

Geological Control of Floristic Composition in Amazonian Forests

by

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Dissertation submitted in partial fulfillment of  
the requirements for the degree of Doctor of Philosophy  
in the University Program in Ecology  
in the Graduate School  
of Duke University

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ABSTRACT

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## Abstract

Amazonia contains the largest remaining tracts of undisturbed tropical forest on earth, and is thus critical to international nature conservation and carbon sequestration efforts. Amazonian forests are notoriously difficult to study, however, due to their species richness and inaccessibility. This has limited efforts to produce the accurate, high-resolution biodiversity maps needed for conservation and development. The aims of the research described here were to identify efficient solutions to the problems of tropical forest inventory; to use these methods to identify floristic patterns and their causes in western Amazonia; and propose new means to map floristic patterns in these forests.

Using tree inventories in the vicinity of Iquitos, Peru, I and a colleague systematically evaluated methods for rapid tropical forest inventory. Of these, inventory of particular taxonomic groups, or taxonomic scope inventory, was the most efficient, and was able to capture a majority of the pattern observed by traditional inventory techniques with one-fifth to one-twentieth the number of stems and species. Based on the success of this approach, I and colleagues specifically evaluated two plant groups, the Pteridophytes (ferns and fern allies) and the Melastomataceae (a family of shrubs and small trees), for use in rapid inventory. Floristic patterns based on inventories from

either group were significantly associated with those based on the tree flora, and inventories of Pteridophytes in particular were in most cases able to capture the majority of floristic patterns identified by tree inventories. These findings indicate that Pteridophyte and Melastomataceae inventories are useful tools for rapid tropical forest inventory.

Using Pteridophyte and Melastomataceae inventories from 138 sites in northwestern Amazonia, combined with satellite data and soil sampling, I and colleagues studied the causes of vegetation patterns in western Amazonian forests. On the basis of these data, we identified a floristic discontinuity of at least 300km in northern Peru, corresponding to a 15-fold difference in soil cation concentrations and an erosion-generated geological boundary. On the basis of this finding, we assembled continent-scale satellite image mosaics, and used these to search for additional discontinuities in western Amazonia. These mosaics indicate a floristic and geological discontinuity of at least 1500km western Brasil, driven by similar erosional processes identified in our study area. We suggest that this represents a chemical and ecological boundary between western and central Amazonia.

Using a second network of 52 pteridophyte and soil inventories in northwestern Amazonia, we further studied the role of geology in generating floristic pattern. Consistent with earlier findings, we found that two widespread geological formations in western Amazonia differ eight-fold difference in soil cation concentrations and in a

majority of their species. Difference in elevation, used as a surrogate for geological formation, furthermore explained up to one-third of the variation in plant species composition between these formations. Significant correlations between elevation, and cation concentrations and soil texture, confirmed that differences in species composition between these formations are driven by differences in soil properties. On the basis of these findings, we were able to use SRTM elevation data to accurately model species composition throughout our study area.

I argue that Amazonian forests are partitioned into large-area units on the basis of geological formations and their edaphic properties. This finding has implications for both the ecology and evolution of these forests, and suggests that conservation strategies be implemented on a region-by-region basis. Fortunately, the methods described here provide a means for generating accurate and detailed maps of floristic patterns in these vast and remote forests.

To Leena,

And those working to protect this world's natural systems.

“Rare is the enterprise which offers so little grounds for optimism  
and demands so much from our power to hope.”

– Egbert Leigh Jr.

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## Chapter 1. Introduction

Amazonia contains the largest remaining tracts of undisturbed tropical forest on earth. These forests harbor the most diverse plant and animal communities known to science (Gentry 1988, Valencia et al. 1994), and store and process globally significant amounts of carbon (Malhi et al. 2008, Phillips et al. 2009). Amazonian forests are thus of the utmost importance to the earth's carbon budget and to the goal of conserving biodiversity. However, the physical and technical challenges of research in the remote expanses of this continent-sized area have stifled efforts to produce the biodiversity maps needed for conservation and development planning (Margules and Pressey 2000, Noss et al. 1999). As a result, knowledge of the biota of much of Amazonia remains in what John Terborgh has termed "the stone age" (Terborgh 1992). UNESCO maps for Amazonia, an area roughly two-thirds the size of the continental United States, recognize "a scant half-dozen vegetation types" (Terborgh and Andresen 1998, commenting on UNESCO 1980), in comparison to the estimated 4100 types recognized for the United States (Grossman et al. 1998). Large-area maps, furthermore, are generally based on surrogate environmental variables or expert opinion rather than field data (Dinerstein et al. 1995). Accurate vegetation maps, supported by a clear understanding of the causes of floristic patterns, are thus crucial for both the study and conservation of Amazonian forests.

Soil properties are known to control plant species distributions in tropical forests at sites ranging from central America, to southeast Asia, to the expanses of Amazonia (Duivenvoorden 1995, Duque et al. 2009, Honorio et al. 2009, John et al. 2007, Palmiotto et al. 2004, Phillips et al. 2003, Salovaara 2004, Tuomisto et al. 2003c). Within Amazonia, large-area patterns in soil properties are believed to have produced long-distance and possibly abrupt patterns in floristic composition, driven by the Andean orogeny (Ter Steege et al. 2000, Ter Steege et al. 2006). This raises the possibility that underlying geological processes may control floristic composition in Amazonia (Ter Steege et al. 2006, Tuomisto et al. 1995, Pitman et al. 2008). This would provide a general model for floristic patterns in these forests, and open new avenues for their mapping and study.

The objective of my research was to study the relationship between geological and floristic patterns in a sector of northwestern Amazonia; and to use this information to map these patterns. Geological study in western Amazonia has revealed a complex history of depositional and erosional events, dating to the Miocene and driven by the Andean orogeny. These processes have generated a widespread mosaic of geological formations of varying size, age, and properties, much of which is documented in national geological maps (IMGEMMET 2000, Schobbenhaus et al. 2004). The implications of these patterns for floristic composition are poorly known, however, and this relationship has been difficult to test due to a lack of large-area but detailed floristic, edaphic, and geological datasets.

One challenge to studies of plant compositional patterns in Amazonian forests is a lack of plant inventory data. Floristic inventory in the Neotropics is notoriously difficult due to extremely large numbers of species (Duivenvoorden 1994; Valencia et al. 1994; Ter Steege et al. 2000; Pitman et al. 2001), the poor state of their taxonomy (Prance 1994), and the difficulties of field identification. For at least 50 years, the dominant solution to these problems has been to restrict sampling to the tallest trees in the forest (Campbell 1989; Ter Steege et al. 2000 and references therein). This technique, however, remains time-consuming, and requires the identification of large numbers of individual trees, almost all of which are tall and thus difficult to voucher and identify (e.g., Pitman et al. 2001; Condit et al. 2002). More efficient solutions to the challenges of forest inventory would thus be a boon to the mapping and study of these forests.

A second challenge to studying patterns in these forests is their inaccessibility. Road networks are absent from much of Amazonia, and western Amazonia is particularly inaccessible. Though inaccessibility has so far inhibited large-scale colonization, it has also hindered biological exploration. Inventories have typically been limited to sites close to population centers and along rivers, and large expanses of forest in interfluvial zones thus remain unsampled. Remotely-sensed (e.g. satellite) data offers a potential solution to these problems. Patterns in Landsat imagery can be used to identify changes in plant species composition, and geomorphological features in SRTM (Shuttle Radar Topography Mission) elevation data can be used to identify geological

formations (Tuomisto et al. 2003a, Thessler et al. 2005, Rossetti and Valeriano 2007). Such data offer the possibility of extrapolating patterns of geology and vegetation from inventoried areas into blank regions of the map. These satellite datasets are furthermore highly accurate and publicly available, making them very well suited to the needs of conservation planners.

To meet these challenges, I evaluated a variety of methods for accelerating tropical forest inventories, and specifically tested two plant groups for their use in rapid forest inventory in Amazonia. I then combined these plant inventories with satellite imagery and soil sampling to study the relationship between vegetation and geology over a much larger expanse of Amazonian forest. I conclude that Amazonian forests are partitioned into large-area units on the basis of geological formations and their soil properties, and demonstrate the use of satellite imagery to map these patterns. This research provides a general model for the creation of vegetation patterns in Amazonian forests, and new tools for mapping these patterns.

This work is described in four chapters, written as research articles. Following are brief summaries:

**Chapter 2: Rapid tropical forest inventory: a comparison of techniques using inventory data from western Amazonia**

*Co-author:* Kalle Ruokolainen (Univ. of Turku, Finland)



*Published: Conservation Biology, 2004, 18:799-811*

Using tree inventories in the vicinity of Iquitos, Peru, we systematically evaluated methods for rapid tropical forest inventory, including the use of presence-absence data; identification of specimens only to genus or family; the inventory of only particular diameter classes; and the inventory of only particular taxonomic groups (either families or genera). Of these methods, inventory of particular taxonomic groups, or “taxonomic scope” inventory, was the most efficient, and was able to capture a majority of the information yielded by traditional inventory techniques with one-fifth to one-twentieth the number of stems and species.

### **Chapter 3: Are floristic and edaphic patterns in Amazonian rain forests congruent for trees, pteridophytes and Melastomataceae?**

*Co-authors:* Kalle Ruokolainen (Univ. of Turku, Finland), Hanna Tuomisto (Univ. of Turku, Finland), Manuel Macia (Real Jardín Botánico de Madrid, Spain), and Marku Yli-Halla (MTT Agrifood Research, Finland)

*Published: Journal of Tropical Ecology, 2007, 23:13–25*

Based on the success of taxa-based inventory, we specifically evaluated two plant groups, the Pteridophytes (ferns and fern allies) and the Melastomataceae (a family of

shrubs and small trees), for use in rapid inventory, using plant inventories in Iquitos (Peru), Madre de Dios (Peru), and the Yasuní National Park (Ecuador). The patterns of similarity between sites based on inventories of these two plant groups were significantly correlated with patterns based on tree species composition in all but one case (Melastomataceae at Yasuni). Inventories of Pteridophytes, in particular, were able to capture the majority of floristic patterns identified by tree inventories in two of three regions. These findings indicate that Pteridophyte and Melastomataceae inventories are useful tools for rapid tropical forest inventory.

#### **Chapter 4: Long-term Sub-Andean Tectonics Control Floristic Composition in Amazonian Forests**

*Co-authors:* Kalle Ruokolainen (Univ. of Turku, Finland), Hanna Tuomisto (Univ. of Turku, Finland), Nelly Llerena (Univ. of Turku, Finland), Glenda Cardenas (Univ. Particular de Iquitos, Peru), Oliver Phillips (University of Leeds, UK), Rodolpho Vasquez (Missouri Botanical Gardens, USA), and Matti Räsänen (Univ. of Turku, Finland)

Using Pteridophyte and Melastomataceae inventories from 138 sites in northwestern Amazonia, combined with satellite data and soil sampling, we studied the correlates of vegetational heterogeneity in western Amazonian forests. Geological

studies of western Amazonia indicate a complex history of deposition and erosion, dating to the Miocene and culminating in two dominant patterns: a long frontier in western Brasil between the cation-rich Pebas Formation and cation-poor Ica Formation (found in western and central Amazonia respectively); and a matrix of cation-rich Pebas Formation in western Amazonia containing elevated islands of more recent, cation-poor sediments. Our objective was to determine the importance of these geological patterns for floristic composition.

On the basis of these data, we identified a floristic discontinuity extending over at least 300km in northern Peru, corresponding to a 15-fold difference in soil cation concentrations and an erosion-generated geological boundary. This boundary corresponded to a division between the widespread, cation-rich Pebas Formation, and a higher-elevation island of cation-poor sediments (the Nauta Formation). Furthermore, this boundary was clearly visible as matched patterns in SRTM (Shuttle Radar Topography Mission) elevation data, and Landsat imagery. On the basis of this finding, we assembled continent-scale SRTM and Landsat mosaics and used these to examine the long boundary between the Ica and Pebas Formations. These mosaics indicate a floristic and geological discontinuity of at least 1500km, driven by similar erosional processes identified in our study area, and we suggest that this represents a chemical and ecological boundary between western and central Amazonia.

## **Chapter 5: Geological control of floristic composition in Amazonian forests**

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Using a second network of 52 pteridophyte and soil inventories in northwestern Amazonia, we studied further the contrast between mesa-like islands of cation-poor Nauta Formation and the underlying Pebas Formation matrix. Consistent with our previous findings, these geological formations differ 8-fold in soil cation concentrations, and a majority of species are significantly associated with one of the two formations. Furthermore, differences in elevation, used as a surrogate for geological formation, explained up to one-third of the variation in plant species composition. Significant correlations between elevation, and cation concentrations and soil texture, confirmed that differences in species composition between these formations are driven by differences in soil properties. On the basis of these findings, we were able to use SRTM elevation data to accurately model species composition throughout our study area.

The work reported here was done in collaboration with colleagues at a variety of institutions, and these collaborators are listed as co-authors on the above chapters. These

chapters are thus written in the first-person plural. In addition, chapters two and three, have been published in the journals noted above.

## **Chapter 2. Rapid tropical forest inventory: a comparison of techniques using inventory data from western Amazonia**

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### ***Summary***

Floristic inventory is critical for conservation planning in tropical forests. Tropical forest inventory is hampered by large numbers of species, however, and is usually abbreviated by sampling only the tallest trees in the forest, an approach that remains time-consuming. In a systematic effort to identify better means of abbreviating inventory in western Amazonia, we defined four classes of inventory abbreviation and evaluated them for use in inventory: occurrence metric, the occurrence metric measured for individual taxa (e.g., presence-absence); taxonomic resolution, the taxonomic level to which stems are identified; diameter class, the diameter classes to be included in inventory; and taxonomic scope, the taxon or taxa to be included in inventory. Using these four classes and all their possible combinations, we defined > 300 inventory abbreviations and evaluated them using nine inventories near Iquitos, Peru. We

evaluated these abbreviations by four criteria: correlation between the floristic patterns of the full and abbreviated inventories; mean number of stems per site; total number of taxa; and height of inventoried stems. Presence-absence inventories were generally interchangeable with abundance inventories, regardless of the use of other abbreviations. Genus-resolution inventory captured 80 % of the floristic pattern of the full inventory with an 80 % reduction in number of taxa sampled, but did not reduce the number of stems sampled. Diameter-class-based inventories, using either species or genus identifications, revealed a majority of the floristic pattern of the full inventories with a fraction of the stems and taxa, but were indistinguishable in efficiency from random sampling. Taxonomic scope abbreviations were more efficient than any other type of inventory, including random sampling, and required one-fifth the number of stems and taxa of diameter-class-based methods and one-twentieth the number of a full inventory. We believe that taxa-based inventory may provide the optimal instrument for biological survey and conservation planning in western Amazonia.

## ***Introduction***

Floristic inventory is critical for conservation planning and management in terrestrial systems. At regional scales, inventory enables the production of vegetation maps (Sayre et al. 2000) and thus the design and management of representative reserve

networks (Noss et al. 1999; Margules & Pressey 2000). At the continental scale, inventory and vegetation maps permit the definition of large-area administrative and planning units, ecoregions, within which conservation planning and management occur (Olson et al. 2001; Wikramanayake et al. 2002).

Floristic inventory in the Neotropics is notoriously difficult due to the extremely large numbers of species (Duivenvoorden 1994; Valencia et al. 1994; Ter Steege et al. 2000; Pitman et al. 2001), the poor state of their taxonomy (Prance 1994), and the difficulties of field identification. For at least 50 years, the dominant solution to these problems has been to restrict sampling to trees  $\geq 10$  cm diameter at breast height (dbh; Campbell 1989; Ter Steege et al. 2000 and references therein), the tallest trees in the forest. This method is intended to reduce the number of stems and taxa in inventory while capturing a representative sampling of the local flora. The popularity of this method is also due to historical logging interests, the conspicuous nature of canopy trees, and their structural dominance in tropical forests (Webb et al. 1967; Campbell 1989).

Despite decades of use in tropical forests across the world, the ability of tall trees to represent regional or continental floristic patterns has never been evaluated. More importantly, this technique is time-consuming, requiring large numbers of individuals and massive numbers of taxa, almost all of which are tall and thus difficult to collect and identify (e.g., Pitman et al. 2001; Condit et al. 2002; see below). This has limited



inventory in the Neotropics, and particularly western Amazonia, forcing researchers to extrapolate large-area patterns from a small number of sites (Pitman et al. 1999; Pitman et al. 2001; Condit et al. 2002). Not surprisingly, estimates of the degree of compositional heterogeneity in western Amazonia currently vary by two orders of magnitude—from homogeneity over thousands of kilometers (Pitman et al. 2001) to pervasive heterogeneity over distances as small as 10 – 100 km (Tuomisto et al. 1995, 2003a).

This uncertainty has profound implications for the protection of these forests. Compositional homogeneity throughout western Amazonia could be a boon for conservation, as effective conservation may require a relatively small number of protected areas, any of which might be planned and managed by a single nation. Widespread heterogeneity, however, would require a more substantial, transnational network of protected areas and thus cooperative planning and management. The sole means of reconciling these positions and different prescriptions for conservation planning is an extensive, systematic program of inventory in western Amazonia (Olson et al. 2002; see below). This, in turn, requires more efficient solutions to the challenges of tropical forest inventory.

The simplest way to accelerate inventory is to reduce the number of individuals and taxa in inventory and the amount of information collected for these stems—a process we refer to as inventory abbreviation. Many means of abbreviating inventory are available other than the sampling of tall trees, and we have identified four classes of

inventory abbreviations: the sampling only of particular diameter classes; the sampling only of a particular taxon or taxa; the identification of stems only to genus or family; and the use of the presence-absence occurrence metric. Although each of these abbreviations has been used in tropical forest inventory, only three studies have evaluated a subset of these for this purpose (Webb et al. 1967; Ruokolainen et al. 1997; Kessler & Bach 1999). Furthermore, abbreviations from each class may be used both alone and in combination with those from every other class.

We evaluated these four classes of inventory abbreviations, alone and in all possible combinations, for a total of 15 types of inventory abbreviations and over 300 individual inventory abbreviations. This represents the first systematic evaluation of inventory methodologies, including the dominant  $\geq 10$  cm dbh (diameter at breast height) diameter class, for any tropical forest. In addition, these evaluations were directly comparable, allowing us to identify the most efficient means of inventorying the forests in our study area. Though our findings are limited to western Amazonia, the methods we describe can be applied to any tropical forest. We thus believe these findings may encourage a new generation of tropical forest inventory techniques and enable tropical conservation planning at previously impossible scales.

## ***Methods***

### **Inventory data**

We used tree inventories at nine lowland sites (approximately 100-150 m above sea level) near Iquitos, Peru, to evaluate inventory abbreviations (Fig. 1; dataset described in Ruokolainen et al. [1997] and Ruokolainen & Tuomisto [1998]). The climate of this area is humid (annual precipitation 3000mm) and hot (average 26°), and the sites were located in undisturbed lowland terra-firme rainforest. As such these sites are typical of the forests of western Amazonia and by some accounts lie within a single floristic unit that extends for 1000s of km (Prance 1990). The sites were selected to represent regional variations in geology or satellite image reflectance, and were distributed along a soil nutrient gradient ranging from poor loamy soils to richer clayey soils.

Our inventories consisted of four 20 m by 20 m plots (0.16 ha total area) distributed along 1.3 km transects. These plots were placed such that only closed-canopy forest was sampled and such that two of the four plots were placed on hilltops and two in valley bottoms. This design was intended to avoid recent tree-fall gaps and ensure a representative sampling of the local flora. At each plot Ruokolainen and colleagues

identified all woody, free-standing stems  $\geq 2.5$  cm dbh to species or morphospecies, estimated their heights, and measured their dbh. Our full inventories thus consist of lists of species with stems  $\geq 2.5$  cm dbh and the abundance of these species. Species and morphospecies were treated equivalently during all analyses.

## **Creation of abbreviated inventories**

We created abbreviated inventories for our nine sites using four classes of inventory abbreviations: (1) diameter class, the diameter classes to be included in inventory (e.g.,  $\geq 10$  cm dbh, 3 to 4 cm dbh); (2) taxonomic scope, the taxon or taxa to be included in inventory (e.g., the Melastomataceae, *Eschweilera* plus *Pithecellobium*); (3) taxonomic resolution, the taxonomic level to which stems were identified (family, genus, species); and (4) occurrence metric, the occurrence metric measured for individual taxa (e.g., presence-absence, abundance classes, abundance).

Within each of these classes we selected individual inventory abbreviations and used these to create our abbreviated inventories. We selected two occurrence metrics, presence-absence and abundance (number of stems per site). We also selected three degrees of taxonomic resolution: species, genus, and family. Unidentified genera (353 individuals, 8.9% of all stems) or families (18 individuals, < 1% of all stems) were excluded from abbreviated inventories at genus or family resolution, respectively.

We selected three commonly-used tall diameter classes ( $\geq 10$ ,  $\geq 15$ , and  $\geq 20$  cm dbh) and either 14 or 27 short diameter classes, depending on their taxonomic resolution (see below). Short diameter classes were those for which  $\geq 70\%$  of the stems were  $\leq 7$  m in height, and tall diameter classes were those for which  $< 70\%$  of stems were  $\leq 7$  m in height. This rule was chosen because identifiable material is easily collected from trees  $\leq 7$  m in height (i.e., these trees do not require tree-climbing or long telescoping pruners) and because 70% represents a majority of stems. This rule also separated understory taxa from canopy groups and is preferable to mean or median height because these measures are not sensitive to differences in numbers of tall stems when large numbers of short stems are also present (e.g., when comparing the effective height of taxa, all of which have many individuals in small diameter classes).

We chose our short diameter classes by a systematic search for short classes. During this process, we created nested sets of short diameter classes at 0.5-cm intervals by adding diameter classes of increasing length (at 0.5 cm increments) to each set until  $< 70\%$  of stems in the new diameter class were  $\leq 7$  m in height or until we generated a diameter class that correlated with the full inventories with an  $r \geq 0.8$  (Pearson correlation between distance matrices of full and abbreviated inventories; see below), whichever came first. This process was conducted with both species- and genus-resolution data, and resulted in 14 species-resolution diameter classes and 27 genus-resolution diameter classes.

To ensure comparability of species- and genus-resolution diameter classes in later analyses (comparison of individual categories to random samples and regression analyses), all diameter classes represented at genus-resolution but not at species-resolution were also generated at species resolution (an additional 13 species-resolution diameter classes; characteristics not reported in detail). Lastly, because this process did not generate a set of diameter classes with a sufficiently wide range of stem numbers, taxa numbers, or stem heights for later analyses, we generated an additional 16 diameter classes using both species- and genus-resolution data (characteristics not reported in detail; chosen without knowledge of  $r$  values): 5.5 to < 6 cm, 6 to < 6.25 cm, 6.25 to < 6.5 cm, 6.5 to < 7 cm, 7 to < 8 cm, 8 to < 8.5 cm, 8.5 to < 9 cm, 9 to < 9.5 cm, 9.5 to < 13 cm,  $\geq$  13 cm, 5 to 6 cm, 6 to 7 cm, 7 to 8 cm, 8 to 9 cm, 9 to 10 cm, and 2.5 to 10 cm. In total, our analyses employed 46 diameter classes identified to both genus and species.

We selected the 10 most species-rich and abundant families and genera for a total of 14 families and 16 genera. We did not evaluate individual species because it is unlikely that one species could represent the floristic pattern of the full inventories. Of the chosen families and genera, one family (the Chrysobalanaceae) and four genera (Rinorea, Mabea, Licania, and Micropholis) lacked stems at one of the nine sites and were excluded from the analyses. The 13 families selected for the taxonomic scope analyses were thus, in order of abundance, the Leguminosae, Myristicaceae, Euphorbiaceae, Burseraceae, Lecythidaceae, Sapotaceae, Meliaceae, Violaceae,

Annonaceae, Moraceae, Rubiaceae, Lauraceae, and Myrtaceae; and the 12 genera were, in order of abundance, *Eschweilera* (Lecythidaceae), *Protium* (Burseraceae), *Guarea* (Meliaceae), *Virola* (Myristicaceae), *Inga* (Leguminosae), *Iryanthera* (Myristicaceae), *Siparuna* (Monimiaceae), *Pithecellobium* (Leguminosae), *Sloanea* (Eleocarpaceae), *Miconia* (Melastomataceae), *Pouteria* (Sapotaceae), and *Trichilia* (Meliaceae).

We also selected the most abundant and species-rich, short-stature families and genera. Short-stature families and genera were those for which 70% of stems were  $\leq 7$  m in height. These families or genera were, in order of abundance, the Meliaceae, Violaceae, Rubiaceae, Myrtaceae, Melastomataceae, Flacourtiaceae, Nyctaginaceae, *Guarea* (Meliaceae), *Trichilia* (Meliaceae), and *Neea* (Nyctagniaceae). The only additional taxa selected by this criterion were thus the Nyctaginaceae, Flacourtiaceae, Melastomataceae, and *Neea*.

We selected a number of family-family and genus-genus combinations. Due to the large number of possible combinations, we did not test all pair-wise combinations of taxa. Instead, families and genera were selected by their correlation with the full inventories, their height, their stem and taxa numbers, the ease with which they are spotted in the field, the ease of their morphospecies identifications, and their taxonomic status (see below for a description of these criteria). These taxa combinations thus do not represent an unbiased sampling of all the possible combinations of taxa but instead

illustrate the potential of taxonomic-scope abbreviations. In total, our taxonomic scope analyses included 16 families, 13 genera, and 13 combinations of families and genera.

After selecting our abbreviations we created abbreviated inventories for the nine sites. Abbreviations from each of the four classes were used alone and in combination with all other abbreviations under the constraint that abbreviations from the same class were not combined (i.e., we did not use more than one diameter class and one taxonomic scope per abbreviation). The only exceptions to this rule were the thirteen taxa combinations noted above. We created our abbreviated inventories by selecting stems of the appropriate taxa or diameter class from the full inventories; identifying these to family, genus, or species; and recording their abundance or presence-absence.

## **Evaluation of inventory abbreviations**

We used four criteria to evaluate inventory abbreviations: (1) correlation between the floristic patterns of the abbreviated inventories and the full flora (Pearson's  $r$ ); (2) mean number of stems per site; (3) total number of taxa across the nine sites; and (4) height of inventoried stems measured as the percentage of stems  $\leq 7$  m tall. The first criterion ensures that abbreviations will yield inventories that represent the floristic pattern present in the full flora. The second and third criteria reduce the number of vouchers to be collected, the number of potentially time-consuming identifications that



must be made, and the number of specimens submitted to experts. The fourth criterion minimizes stem height and thus the difficulty of collecting identifiable material.

We used the Pearson correlation coefficient ( $r$ ) to measure the ability of abbreviated inventories to represent the floristic patterns of the full dataset. Pearson's  $r$  was calculated as the correlation between the distance matrix for the full inventories and that for the abbreviated inventories. A distance matrix is a square, symmetric matrix in which rows and columns are sites (also called a "site x site" matrix) and cells are the floristic distance between pairs of sites (e.g., percent shared species for presence-absence data or percent individuals of shared species for abundance data). A single distance matrix thus represents the floristic pattern amongst sites for a single set of inventories. By comparing the distance matrix of each abbreviated inventory with that of the full inventory, we were able to measure the correlation between the floristic patterns revealed by the full and abbreviated inventories (Kent & Coker 1992: 91-96; Sokal & Rohlf 1995: 813-817; Tuomisto et al. 1995; Ruokolainen et al. 1997; Tuomisto et al. 2003a).

We calculated floristic distance between sites with the Jaccard coefficient for presence-absence data and the Bray-Curtis coefficient for abundance data (Legendre & Legendre 1998). Distances for the full inventories were calculated with the Bray-Curtis index, and stems in the full inventories were identified to species. All correlation coefficients were calculated with PC-ORD (McCune & Mefford 1999). The square of Pearson's  $r$  is the percentage of floristic variation in the full inventories captured by the

abbreviated inventory. An  $r$  value  $\geq 0.71$  thus indicates that the abbreviated inventory captured 50% or more of the floristic pattern of the full inventories, and we used this value to identify potentially useful abbreviations. Due to unavoidable dependence between the full matrix and test matrices, we were unable to calculate the significance of these correlations.

We also compared the performance of individual abbreviations with the performance of random samples with equivalent numbers of stems or taxa. We began by generating 50,000 samples of random size from the total set of 3970 individuals, such that each sample had at least one stem from each of the nine sites (random samples constructed with Resampling Stats [Resampling Stats Inc. 1999]). We used presence-absence data and the Jaccard index to construct a distance matrix for each random sample, and calculated its correlation with the full inventories (as above). We then grouped the random samples by either number of stems or number of species into 15 intervals, each of which contained a minimum of 1000 samples. For each interval, we calculated the mean number of stems or species, mean  $r$ , and the uppermost and lowermost limits of  $r$  for a 95% confidence interval. Lastly, we plotted mean stem or species numbers versus mean  $r$  and the 95% confidence limits and compared these to values for the test inventories.

## **Results**

### **Inventory data**

Our full inventories sampled a total of 3970 individuals from 1190 species, 259 genera, and 69 families; and a mean of 441 stems per site (range: 366-544), from 233 species (range: 204-272), 110 genera (range: 90-126), and 46 families (range: 42-50). A mean of 35% of the species at a site were unique to that site (range: 29-44%), and this figure was considerably smaller for genera (7.4%; range: 3.3-12%) and families (1.6%; range: 0-4.4%). Pairs of sites shared a mean 12% of their species (range: 1% to 21%).

### **Creation of abbreviated inventories**

Combining our four classes of abbreviations yielded 15 categories of inventory abbreviations: occurrence metric abbreviations (the use of presence-absence data); taxonomic resolution abbreviations (genus or family resolution inventory); diameter class abbreviations (the sampling only of stems of a certain diameter at breast height); taxonomic scope abbreviations (the sampling only of stems within a certain taxon or taxa); diameter classes at genus or family resolution; taxonomic scopes at genus or

family resolution; diameter classes of a particular taxonomic scope; diameter classes of a particular taxonomic scope at genus or family resolution; and the seven preceding categories using presence-absence data. Six of these 15 categories, those that combined a taxonomic scope abbreviation with any abbreviation other than the use of presence-absence data, effectively failed to produce abbreviations with  $r \geq 0.71$  during preliminary analyses and were not explored further (see below). These were taxonomic scopes at genus or family resolution, diameter classes of a particular taxonomic scope, diameter classes of a particular taxonomic scope at genus or family resolution, and each of these using presence-absence data.

Within the nine categories of inventory abbreviation that yielded abbreviations with  $r \geq 0.71$ , we created and evaluated 273 individual inventory abbreviations: presence-absence inventory (1 abbreviation); family or genus resolution inventory (2 abbreviations); diameter classes (46 abbreviations); taxonomic scopes (42 abbreviations); diameter classes at genus resolution (46 abbreviations; we were unable to identify useful diameter classes at family resolution); and each of the preceding four using presence-absence data (136 abbreviations). Within the six categories of inventory abbreviation that did not yield useful abbreviations, we evaluated 37 inventory abbreviations during preliminary analyses (see below). In total we created and evaluated 310 inventory abbreviations.

## **Evaluation of inventory abbreviations**

### **Occurrence metric analyses**

The presence-absence occurrence metric was evaluated both alone (Table 1) and in combination with all other abbreviations (Tables 2 to 5). The  $r$  values for pairs of abbreviations that differed only in occurrence metric were strongly correlated ( $r^2 = 0.94$ ), and the mean difference between these  $r$  values was small (0.03, mean abundance  $r$  exceeds mean presence-absence  $r$ ). However, the standard deviation of these differences was about twice the mean ( $SD = 0.06$ ); thus, differences for individual abbreviations could be quite large.

### **Taxonomic resolution analyses**

Genus-level identifications preserved approximately 80% of the information in the full inventories with 22% of the number of taxa (Table 1;  $r = 0.89$ , abundance data; 259 genera vs. 1190 species). Family identifications preserved roughly one-third of the information in the full inventories with 6% of the total number of taxa (Table 1;  $r^2 = 0.32$ , abundance data; 69 families). These reductions in taxonomic resolution, from species to

genus to family level, resulted in a consistent decrease in mean floristic difference between sites (0.88 to 0.58 to 0.32, respectively; abundance data).

### **Diameter-class analyses at species or genus resolution**

Two of the three tall species-resolution diameter classes,  $\geq 10$  and  $\geq 15$  cm dbh, correlated with the full inventories at  $r \geq 0.71$  (Table 2). Of these the  $\geq 10$  cm dbh diameter class performed the best, capturing 69% of the floristic variation in the full inventories ( $r^2 = 0.69$ , abundance data) with 25% of the number of stems per site and 40% of the number of taxa (100 stems per site and 477 species). Stems in the 10 cm dbh diameter class were generally very tall, however, and practically none were within easy reach (mean height 17 m; 96.9% of stems  $> 7$  m tall). Nine short species-resolution diameter classes correlated with the full inventories at  $r \geq 0.71$  (Table 2; presence-absence or abundance data), and the  $r$  values for four of these matched or exceeded that of the  $\geq 10$  cm dbh abbreviation. One of these, 3 to 4 cm dbh, was comparable to the  $\geq 10$  cm dbh abbreviation in number of stems per site (99) and total number of species (480).

Ten of the short genus-resolution diameter classes correlated with the full inventories at  $r \geq 0.71$  (Table 3; presence-absence or abundance data). The most efficient genus-resolution diameter classes, however, were the tall  $\geq 10$  cm and  $\geq 15$  cm dbh

diameter classes, which provided high  $r$  values for significantly lower numbers of stems and taxa than the short diameter classes or the full inventories (Table 3).

Of the diameter classes not reported in detail (29 species-resolution diameter classes and 16 genus-resolution diameter classes), 15 species-resolution diameter classes and one genus-resolution diameter class correlated with the full inventories at  $r \geq 0.71$  (presence-absence or abundance data). Of these 15 species-resolution diameter classes, 15 correlated at  $r \geq 0.71$  using abundance data, and 14 correlated at  $r \geq 0.71$  using presence-absence data. The genus-resolution class correlated at  $r \geq 0.71$  using only abundance data.

Considering all 46 diameter classes, at species or genus resolution, diameter-class abbreviations were indistinguishable from random samples in terms of mean number of stems per site or total number of taxa required for a particular  $r$  value (Fig. 2a, 2b, 2d, & 2e). Accordingly, the number of stems per site or total number of taxa in both species- and genus-resolution diameter classes was a strong predictor of  $r$  (Fig. 2g and 2h). Height of stems was a poor predictor of  $r$ , however: both tall and short diameter classes yielded high  $r$  values, (Fig. 2i), and height of stems and  $r$  were uncorrelated once variations in  $r$  due to variations in stem number were removed ( $r^2 = 0.00$  &  $0.06$ , species and genus resolution diameter classes respectively, after regressing height upon residuals from regressions in fig. 2g)

Lastly, in light of the low  $r$  values that resulted from reducing taxonomic resolution to the family level, and from subsetting the generic-resolution abbreviation by diameter class, we did not evaluate any family-resolution diameter classes.

### **Taxonomic scope analyses**

Approximately one-fifth of the families and genera (6 taxa total) correlated with the full inventories at  $r \geq 0.71$  (Table 4; presence-absence or abundance data). The results for the Lecythidaceae and Pithecellobium were particularly impressive given the small number of stems per site (21 and 6, respectively) and total number of species (22 and 12). Two additional short-stature taxa, the Meliaceae and Guarea, were just below the 0.71 threshold (both at 0.70).

Combining taxa greatly improved the performance of this category of abbreviation. All 13 family-family and genus-genus combinations correlated with the full inventories at  $r \geq 0.71$ , and 8 correlated with  $r \geq 0.8$  (Table 5). Because the above combination groups did not represent an unbiased sampling of the set of possible taxa combinations, however, they were not included in comparisons of taxonomic scope abbreviations with other types of abbreviation.

Taxonomic scope abbreviations performed significantly better than random samples. Almost one-half (41%, 12 of 29) of the taxonomic scope abbreviations required



fewer stems per site than a random inventory to capture an equivalent amount of floristic pattern, and an overwhelming majority (76%, 22 of 29) required fewer taxa (Fig. 2c & 2f). All of the combination taxa, furthermore, performed better than random in regards to number of taxa, and most (69%, 9 of 13) performed better in regards to number of stems.

The mean number of stems per site and total number of taxa in taxonomic scope abbreviations were poor predictors of  $r$  (Fig. 2g, 2h). Height of stems was also a poor predictor of  $r$ . Both tall and short taxa yielded high  $r$  values (Fig. 2i), and height of stems and  $r$  were uncorrelated ( $r^2 = 0.03$ ). We were unable to identify any other potential predictors of the strength of taxonomic scope abbreviations.

Lastly, during preliminary analyses with the three most abundant families, identified to genus or in combination with a number of diameter classes, we were effectively unable to identify any abbreviations with an  $r \geq 0.71$  that combined a taxonomic scope and taxonomic resolution abbreviation, or a taxonomic scope and diameter class abbreviation. Additionally, though preliminary analyses with taxa combinations (family-family or genus-genus combinations) improved the scores of abbreviations that combined diameter classes and taxonomic scopes, these improvements were not substantial. This indicates that taxonomic scope abbreviations should not be combined with any class of abbreviation other than the use of presence-absence data. We thus did not evaluate any additional taxonomic scopes at genus or

family resolution, diameter classes of a particular taxonomic scope, or diameter classes of a particular taxonomic scope at genus or family resolution.

## ***Discussion***

In an effort to identify new means of abbreviating forest inventory in western Amazonia, we conducted a systematic search of four classes of inventory abbreviations, their 15 combinations, and more than 300 individual inventory abbreviations. We consequently identified nine categories and approximately 100 abbreviations that captured a majority of the floristic pattern of a full inventory. This total is two orders of magnitude greater than the number of inventory techniques in common use, and these abbreviations were drawn from a wide range of basic methodologies. This demonstrates that means of abbreviating inventory are much more diverse than currently understood, and that researchers should choose carefully before settling upon a particular strategy.

## **Evaluation and comparison of inventory abbreviations**

### **Presence-absence occurrence metric**

Presence-absence inventories were generally interchangeable with their abundance counterparts, regardless of the use of other abbreviations (in agreement with Tuomisto et al. 2003a). It appears that the compositional and environmental gradients in these forests are sufficiently long, or the distributions of species and genera along these gradients sufficiently narrow, that differences in abundance are not needed to detect differences in the distributions of taxa and hence differences in composition between sites. Alternately, dispersal distances of most species may be sufficiently short that species are either present at a site in high abundance or absent altogether. In either case, presence-absence inventory should be considered an alternative to abundance sampling, particularly when this abbreviation has the potential to simplify fieldwork (e.g., when species are present in high abundances or during multiperson inventories).

### **Genus resolution**

Eliminating species identifications resulted in a negligible loss of information (in agreement with Kessler & Bach [1999]). This suggests that the patterns we observed are manifest at both species and genus resolutions and that both species and genera have partitioned environmental gradients (see below). Identification to genus, furthermore, is generally far easier than identification to species. Genus identifications are thus able to

resolve differences between sites with a number of stems and taxa that are within the abilities of most researchers

### **Diameter classes at species or genus resolution**

Diameter-class-based inventories were indistinguishable in efficiency from random samples, and the strength of these inventories was almost entirely determined by number of stems and taxa regardless of the height of those stems. As such, any diameter class may be used for inventory as long as it captures a sufficient number of stems and taxa. For species-resolution sampling, an average of 100 stems per site and a total of 500 species represented a majority of the floristic pattern in our full inventories (Fig. 2a & 2c, Fig. 3). The  $\geq 10$  cm dbh diameter class is thus eligible for use in inventory but maximizes the height of inventoried stems and thus the difficulties of collection and identification. Instead, shorter diameter classes, such as 3 to 4 cm, may be better suited for inventory. Stems in this class were uniformly short, thus eliminating the need for tree-climbing or long telescoping poles and greatly facilitating sampling.

Eliminating species identifications may further ease diameter-class inventory. This is best illustrated by the  $\geq 10$  cm dbh diameter class, which performed equally well with species or genus identifications. Many short diameter classes also captured a majority of the pattern in the full inventories, but these usually required more stems for

a particular  $r$  value than their species-resolution counterparts. Generally, an average of 150 stems per site and a total of 200 genera represented a majority of the floristic pattern in our full inventories (Fig. 2b & 2d, Fig. 3).

It must be remembered, however, that both species and genus diameter-class abbreviations required large numbers of stems and taxa. This will probably prohibit their use for extensive regional or continent-scale sampling; thus, we do not recommend these inventory techniques for large-area conservation planning.

### **Taxonomic scope**

Taxonomic scope abbreviations, in which only the members of a particular taxon or taxa are sampled, were remarkably more efficient than any other group of abbreviations in revealing floristic patterns. Taxonomic scope abbreviations required one-fifth the stems and taxa of diameter-class-based methods and one-twentieth the stems and species of a full inventory to represent a majority of the floristic pattern in our full inventories (Fig. 3; positions of points and trendlines in Fig. 2g and 2h emphasize this point). The performance of these abbreviations, furthermore, was improved as taxa were combined. As such, these methods represent a tremendous improvement over traditional diameter-class techniques, greatly reducing the time required for sampling and identification. Moreover, these techniques allow investigators to concentrate on the

taxonomy of particular groups, further easing species and morphospecies identifications. These qualities place rapid inventory, for the first time, well within the reach of nonspecialists.

Taxonomic scope abbreviations are, additionally, substantially more efficient than random sampling (in agreement with Kessler and Bach [1999]). This suggests that the members of many taxa have partitioned environmental gradients, due presumably to similarities in ecological traits and thus intra-family or genus competition. As a consequence, taxa sensitive to these gradients may be used to sample both the gradients and subsequent variations in floristic composition. Partitioning of environmental gradients has already been observed for pteridophytes, palms, and the Melastomataceae (Tuomisto & Ruokolainen 1994; Tuomisto et al. 1995; Tuomisto & Poulsen 1996; Ruokolainen et al. 1997; Tuomisto et al. 1998; Vormisto et al. 2000; Tuomisto et al. 2003a, 2003b) and now appears to be true for many woody plant families and genera. Thus, although it is probably impossible to achieve better-than-random efficiencies with diameter-class-based abbreviations, much more efficient taxa-based abbreviations are apparently commonplace.

We were unable to identify predictors of the strength of individual taxonomic scope abbreviations, however. The number of stems and species in individual abbreviations, and their heights, were uncorrelated with their  $r$  values, and we were otherwise unable to identify features that unite useful taxonomic groups. The

determinants of strongly correlating taxa thus deserve attention. Uncertainty regarding this topic, however, should not prevent the use of taxa-based inventory in western Amazonian forests once taxa have been proven for the appropriate areas and spatial scales (see below).

### **Optimizing tropical forest inventory**

Taxa-based inventory is the most efficient means of sampling floristic variation at the sites and spatial scale we studied here. This type of inventory may thus have great potential for biological survey and conservation planning in western Amazonia. A taxonomic group may meet our four criteria, however, and still prove impractical for inventory. The group may be hard to spot in the forest, may be taxonomically unstable, or its members might be difficult to identify to species or morphospecies (criteria recommended by Pearson [1995] and Kessler and Bach [1999]). Furthermore, the group might not be portable (i.e., able to capture floristic patterns in other regions) or scalable (i.e., able to capture both regional and continental floristic patterns).

We thus believe that, for the purposes of inventory, the optimum taxonomic group would (1) have a small mean number of stems per site; (2) have a small total number of species over the area surveyed; (3) be short in height; and (4) represent the floristic patterns in the full flora. The group would also (5) be easily spotted and (6)

relatively taxonomically stable, and (7) species within this group could be easily identified to species or morphospecies. The group should also be (8) represented in all areas surveyed; (9) sensitive, in all areas, to the forces determining composition; and (10) sensitive to the forces acting at all appropriate spatial scales.

If there is one benefit of diameter-class-based sampling over taxa-based sampling, it is that diameter-class inventories can be expected to perform equivalently (as a random sample) in multiple forest types and at multiple spatial scales, whereas taxonomic-scope abbreviations must be evaluated by each of these criteria before being used. Given the tremendous gains in efficiency of taxa-based sampling, however, and the difficulties of traditional methods, we believe an initial investment in the evaluation of these sampling schemes would be worth the rewards.

## **From inventory to conservation planning**

If our results hold true at other sites and spatial scales, taxa-based inventory should serve as the basis for a rapid, systematic, and cost-effective program of sampling in western Amazonia. Taxa-based inventories throughout western Amazonia would first be used, in conjunction with geological and climatological data, to delimit and refine the large-order units—ecoregions—within which further survey and planning would occur (i.e., continent-scale survey; Dinerstein et al. 1995). Systematic inventories



within priority ecoregions would then permit the development of vegetation classifications, the interpretation of remotely sensed imagery, and ultimately the production of regional vegetation maps (i.e., regional-scale survey; Sayre et al. 2000). Using these maps, conservation and development planners could design regional representative protected-areas networks (Noss & Harris 1986; Noss et al 1999; Groves et al. 2000; Margules & Pressey 2000) and provide, for the first time, compelling arguments for their creation and protection. These regional networks would ultimately be connected at the continental scale to form reserve systems that span the ecological and geographic range of the western Amazonian biota (Soulé & Terborgh 1999).

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**Table 1: Characteristics of presence-absence and taxonomic resolution abbreviations for nine sites near Iquitos, Peru.**

<i>Taxonomic resolution</i>	$r$ , <i>abundance</i>	$r$ , <i>presence-absence</i>	<i>Mean no. stems per site</i>	<i>Total no. taxa</i>	<i>Stems <math>\leq 7</math> m (%)</i>
Species	1.00	0.98	441	1190	59
Genus	0.89	0.82	395	259	59
Family	0.57	0.54	439	69	59

**Table 2: Characteristics of diameter classes at species resolution for nine sites near Iquitos, Peru. <sup>a</sup>**

	<i>Diameter class (cm dbh)<sup>b</sup></i>	<i>r, abundance</i>	<i>r, presence-absence</i>	<i>Stems ≤ 7 m (%)</i>	<i>Mean no. stems per site</i>	<i>Total no. species</i>
Short diameter classes	2.5-3	0.65	0.75	100	70	399
	2.5-3.5	0.85	0.89	99	120	568
	3-3.5	0.69	0.72	99	61	363
	3-4	0.81	0.80	98	99	480
	3.5-4	0.69	0.67	96	53	306
	3.5-4.5	0.73	0.72	94	88	437
	3.5-5	0.82	0.80	92	111	498
	4-4.5	0.33	0.26	91	43	273
	4-5	0.63	0.59	88	66	357
	4-5.5	0.72	0.65	83	90	447
	4-6	0.81	0.73	77	113	514
	4.5-5	0.68	0.67	84	35	215
	4.5-5.5	0.67	0.64	77	59	333
	4.5-6	0.75	0.73	71	82	415
Tall diameter classes	≥ 10	0.83	0.80	3.1	100	477
	≥ 15	0.73	0.74	2.1	58	311
	≥ 20	0.60	0.56	2.2	36	215
Full inventory <sup>c</sup>				59	441	1190

<sup>a</sup> Divided into short groups (≥70% are ≤7 m tall) and tall groups (<70% are ≤7 m tall).

<sup>b</sup> Abbreviation: dbh, diameter at breast height.

<sup>c</sup> Characteristics of full inventory (all stems ≥2.5 cm dbh) included for reference.

**Table 3: Characteristics of diameter classes at genus resolution for nine sites near Iquitos, Peru. <sup>a</sup>**

	<i>Diameter class (cm dbb)<sup>b</sup></i>	<i>r, abundance</i>	<i>r, presence-absence</i>	<i>Stems ≤ 7 m (%)</i>	<i>Mean no. stems per site</i>	<i>Total no. genera</i>
Short diameter classes	2.5-3	0.42	0.44	100	61	150
	2.5-3.5	0.52	0.46	99	106	175
	2.5-4	0.59	0.55	98	140	196
	2.5-4.5	0.66	0.58	97	171	202
	2.5-5	0.75	0.65	95	191	208
	2.5-5.5	0.77	0.68	93	212	216
	2.5-6	0.82	0.68	89	233	220
	3-3.5	0.27	0.31	99	54	133
	3-4	0.64	0.53	97	88	165
	3-4.5	0.71	0.54	96	119	177
	3-5	0.76	0.58	94	139	187
	3-5.5	0.77	0.60	90	160	196
	3-6	0.83	0.67	86	181	203
	3.5-4	0.58	0.61	96	48	129
	3.5-4.5	0.63	0.55	94	78	152
	3.5-5	0.73	0.62	92	99	166
	3.5-5.5	0.74	0.66	87	120	181
	3.5-6	0.80	0.70	82	141	188
	4-4.5	0.43	0.42	91	38	114
	4-5	0.56	0.56	88	58	138
	4-5.5	0.56	0.60	82	79	157
	4-6	0.58	0.54	77	100	173
	4-6.5	0.62	0.58	73	112	182
4-7	0.66	0.62	70	126	191	
4.5-5	0.65	0.59	84	32	101	
4.5-5.5	0.58	0.52	77	53	130	
4.5-6	0.56	0.45	71	74	151	
Tall diameter classes	≥10	0.81	0.74	3.3	91	162
	≥15	0.73	0.58	2.3	52	125
	≥20	0.54	0.49	2.4	32	97
Full inventory <sup>c</sup>				59	395	259

<sup>a</sup> Divided into short groups (≥70% are ≤7 m tall) and tall groups (<70% are ≤7 m tall).

<sup>b</sup> Abbreviation: dbb, diameter at breast height.

<sup>c</sup> Characteristics of full inventory (all stems ≥ 2.5 cm dbb) included for reference.

**Table 4: Characteristics of taxonomic scope abbreviations for nine sites near Iquitos, Peru. <sup>a</sup>**

	<i>Taxonomic scope</i>	<i>r, abundance</i>	<i>r, presence-absence</i>	<i>Mean no. stems per site</i>	<i>Total no. species</i>	<i>Stems ≤ 7 m (%)</i>
Tall families	Leguminosae	0.79	0.73	41	134	54
	Myristicaceae	0.79	0.72	32	29	49
	Euphorbiaceae	0.58	0.50	28	37	52
	Burseraceae	0.59	0.55	22	37	58
	Lecythidaceae	0.79	0.79	21	22	44
	Sapotaceae	0.60	0.38	20	95	55
	Annonaceae	0.47	0.52	20	72	64
	Moraceae	0.51	0.42	19	41	61
	Lauraceae	0.09	0.04	17	76	54
	Short families	Meliaceae	0.67	0.70	20	48
Violaceae		0.68	0.72	20	14	71
Rubiaceae		0.63	0.62	18	64	76
Myrtaceae		0.41	0.40	11	52	71
Melastomataceae		0.60	0.49	10	32	71
Flacourtiaceae		0.18	0.21	9	23	72
Nyctaginaceae		0.27	0.40	6	13	75
Tall genera	Eschweilera	0.74	0.75	18	18	42
	Protium	0.62	0.51	16	26	57
	Virola	0.47	0.48	14	16	50
	Inga	0.55	0.57	13	48	61
	Iryanthera	0.62	0.15	12	8	50
	Siparuna	0.13	-0.03	7	12	67
	Pithecellobium	0.81	0.66	6	12	55
	Sloanea	0.27	0.22	6	32	56
	Miconia	0.18	0.21	6	30	64
	Pouteria	0.51	0.52	6	25	57
Short genera	Guarea	0.64	0.70	15	29	73
	Neca	0.27	0.40	6	13	75
Full inventory <sup>b</sup>	Trichilia	0.28	0.26	5	18	73
				441	1190	59

<sup>a</sup> Divided into short groups ( $\geq 70\%$  are  $\leq 7$  m tall) and tall groups ( $< 70\%$  are  $\leq 7$  m tall) and ordered within groups by number of stems.

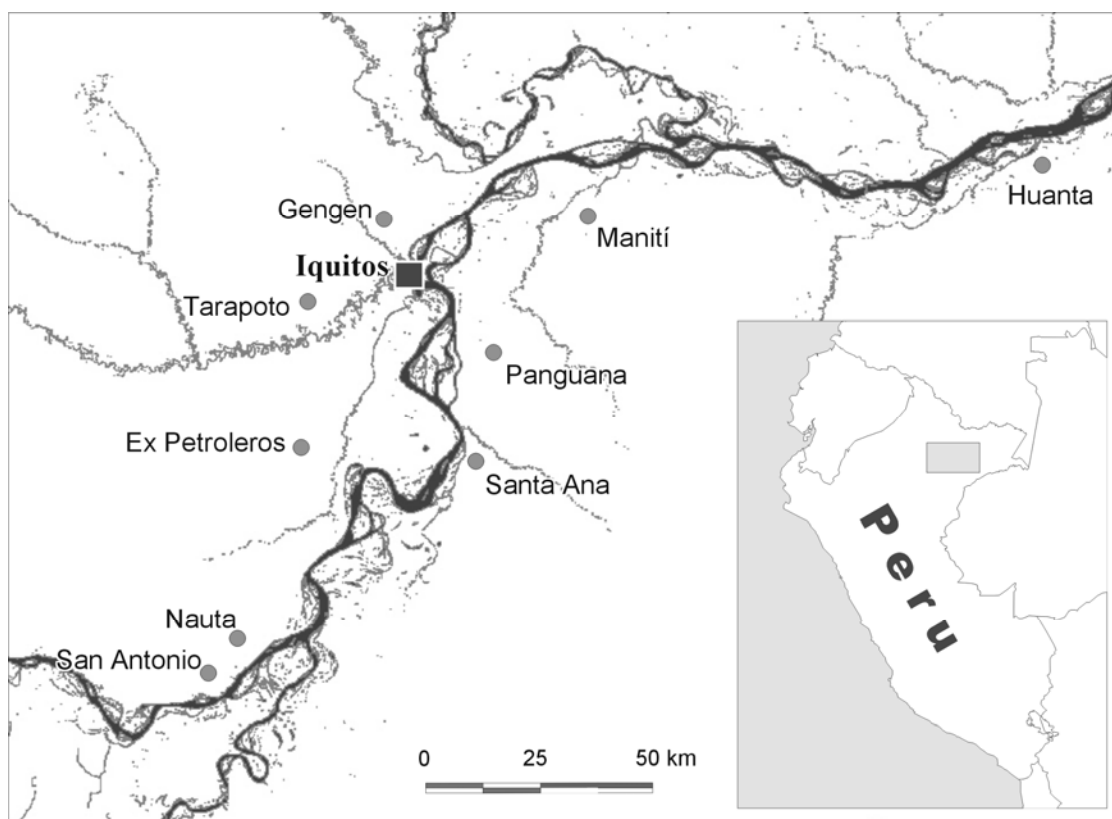
<sup>b</sup> Characteristics of full inventory (all stems  $\geq 2.5$  cm diameter at breast height) included for reference.

**Table 5: Characteristics of taxonomic scope combinations for nine sites near Iquitos, Peru. <sup>a</sup>**

	<i>Taxonomic scope</i>	<i>r, abundance</i>	<i>r, presence-absence</i>	<i>Mean no. stems per site</i>	<i>Total no. species</i>	<i>Stems ≤ 7 m (%)</i>
Tall groups	Leguminosae and Lecythidaceae	0.89	0.82	61	156	51
	Myristicaceae and Lecythidaceae	0.89	0.86	52	51	47
	Myristicaceae and Rubiaceae	0.84	0.72	50	93	59
	Myristicaceae and Melastomataceae	0.85	0.71	41	61	54
	Burseraceae and Melastomataceae	0.78	0.72	31	69	62
	Protium and Guarea	0.73	0.79	31	55	65
	Eschweilera and Pithecellobium	0.84	0.85	25	30	45
	Protium and Pithecellobium	0.84	0.69	22	38	57
	Meliaceae and Violaceae	0.77	0.79	40	62	72
Short groups	Annonaceae and Rubiaceae	0.83	0.83	38	136	70
	Violaceae and Rubiaceae	0.76	0.79	38	78	73
	Meliaceae and Rubiaceae	0.73	0.73	38	112	74
	Rubiaceae and Melastomataceae	0.81	0.76	28	96	74
Full inventory <sup>b</sup>			441	1190	59	

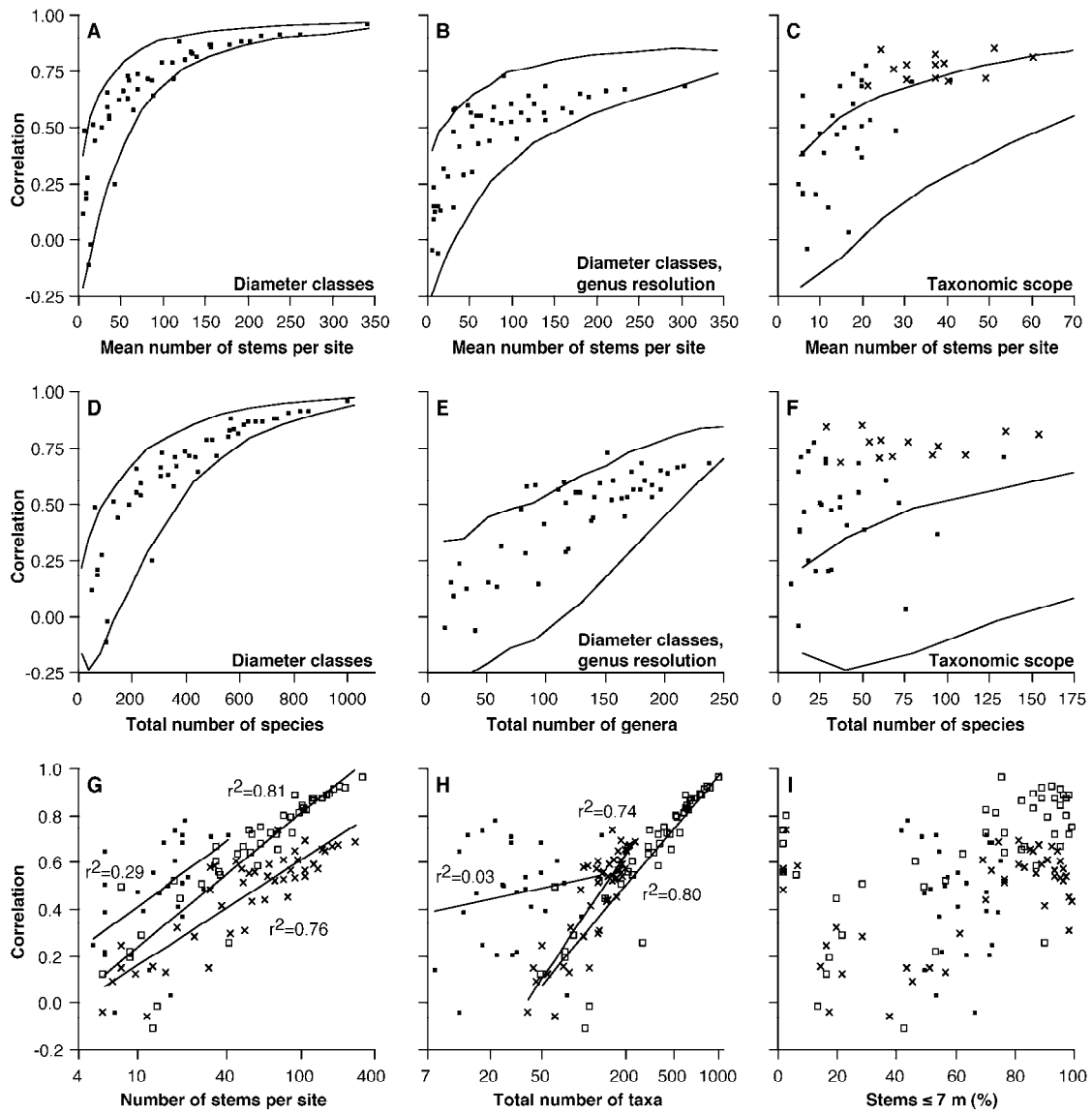
<sup>a</sup> Divided into short groups ( $\geq 70\%$  are  $\leq 7$  m tall) and tall groups ( $< 70\%$  are  $\leq 7$  m tall) and ordered within groups by number of stems.

<sup>b</sup> Characteristics of full inventory (all stems  $\geq 2.5$  cm diameter at breast height) included for reference.



**Figure 1: Location of the nine study sites near Iquitos, Peru.**





**Figure 2: Comparison of diameter classes, diameter classes at genus resolution, and taxonomic scope to random sampling. Comparison of each group to random sampling in terms of (a to c) mean number of stems per site or (d to f) total number of taxa. The two lines represent the 95% confidence interval for random sampling. Crosses in (c) and (f) are 13 taxa combination groups composed of pairs of families or genera with individually high  $r$  values. Regression models for the three groups for (g) number of stems per site versus correlation or (h) total number of taxa versus correlation. (i) height of stems versus  $r$  value for the three groups. Filled squares in (g) to (i) are taxonomic scope abbreviations, crosses are diameter classes at genus resolution, and open squares are diameter classes; taxa combinations not included.**

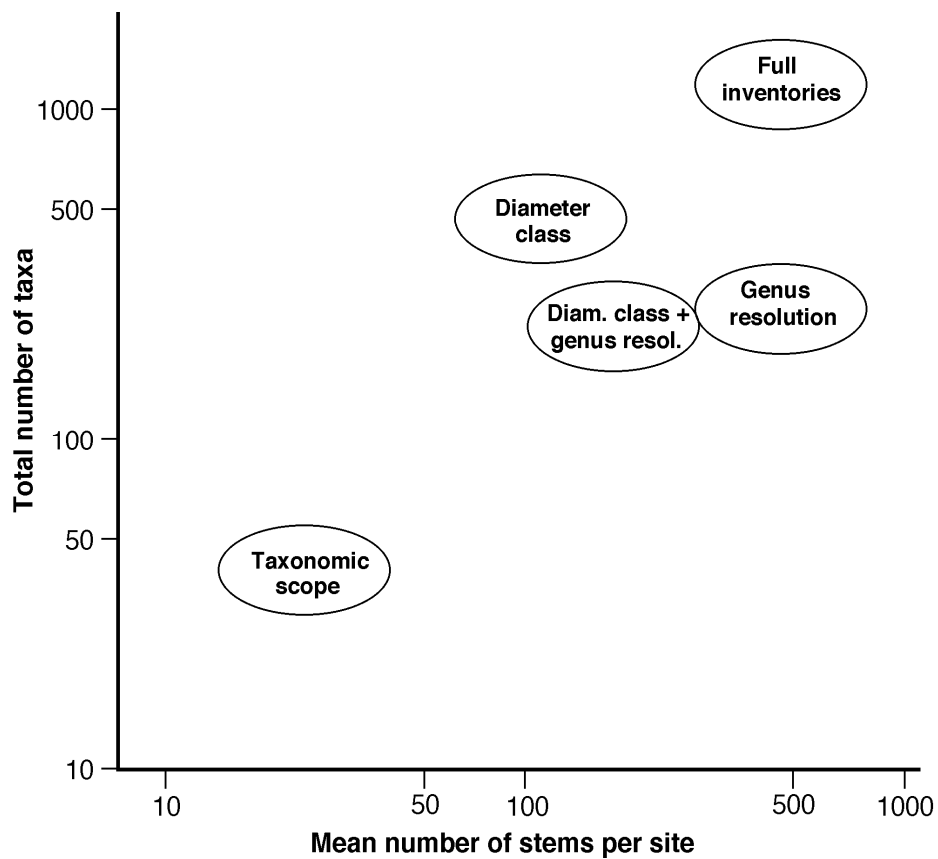


Figure 3: Mean performance of inventory methods for nine sites near Iquitos, Peru. Positions represent the mean number of stems and taxa for each type of inventory for all abbreviations with  $r \geq 0.71$  (abundance data only).

## **Chapter 3: Are floristic and edaphic patterns in Amazonian rain forests congruent for trees, pteridophytes and Melastomataceae?**

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### ***Summary***

Studies in western Amazonian forests have found that similarities in soil cation concentration and texture explain floristic similarities between sites, when these are measured using trees, pteridophytes or Melastomataceae. However, it is not known to what extent the three plant groups react to the same soil characteristics, because tree studies have almost always been conducted in different areas than studies on the understorey plant groups. We made inventories in 23 sites representing non-inundated

rain forests on clayey to loamy soil in three regions of western Amazonia. Significant Mantel correlations between the floristic patterns of trees and pteridophytes were found in all three regions when floristic differences were measured with species presence–absence data. When species abundance data were used, and when the floristic patterns of trees and Melastomataceae were compared, significant correlations were found in one or two regions. Mantel correlations between plant groups were highest in the two regions where the observed variation in soil characteristics was largest. In all regions, the same soil variables emerged with significant Mantel correlations with trees, pteridophytes and Melastomataceae. Soil calcium and magnesium were most frequently retained in the models of multiple regression on distance matrices. On average, soil differences explained 50% of the variation in floristic differences (range = 14– 84%), and geographical distances explained 16% (range = 0-64%). Our results demonstrate that beta diversities of the three plant groups are highly correlated, and that much of this congruence is explained by similar reactions to soil variation. These results support the idea that pteridophytes, and to a lesser degree Melastomataceae, can be used as indicators of general floristic and edaphic patterns in Amazonian rain forests. Since understory plants are much quicker to inventory than trees, this would make it possible to recognise and map floristic patterns over huge areas of lowland Amazonia within a reasonable time.

## ***Introduction***

Vegetation maps are used as sources of habitat information in ecological research and conservation planning. The Natura programme of the European Union and the Gap Analysis of the USA aim at guaranteeing that conservation area networks include all recognised habitat types and preserve sufficient habitat for all species. Whether an approach based on this concept of complementarity (Ferrier 2002) is feasible in tropical forests depends on two fundamental questions. First, are the patterns in species composition and beta-diversity (difference in species composition among sites, Vellend 2001) consistent between plant groups and predictable from external environmental factors? Second, is it possible in practice to define, recognise and map sufficiently detailed habitat types over large enough areas?

In the case of Amazonian lowland rain forests, both questions are still unresolved. In vegetation maps (Huber & Alarcón 1988, IBGE 2004), huge areas of non-inundated terrain with non-podzolised soils (tierra firme) appear uniform. Some researchers maintain that the forests are much more heterogeneous than these maps suggest, and that plant species composition varies widely between sites in response to environmental and particularly edaphic variability (Gentry 1988, Ruokolainen et al. 1997, Tuomisto & Poulsen 1996, Tuomisto et al. 1995, 2003a; Young & León 1989). Others have emphasised the relative homogeneity of the forests, maintaining either that

they are dominated over large areas by an oligarchy of generalist tree species (Macía & Svenning 2005, Pitman et al. 2001, Terborgh et al. 2002), or that species abundances fluctuate randomly in space and time (Condit et al. 2002; the neutral model of Hubbell 2001).

Several recent studies have found that both environmental differences and geographical distances are important in explaining the variation in beta diversity (Duque et al. 2002, Phillips et al. 2003a, Tuomisto et al. 2003b, c; Vormisto et al. 2004). This gives support to both the environmental control model and the neutral model. Despite focusing on plants of different life-forms (trees, palms, shrubs or herbs), all these studies found variation in soil characteristics to be relevant when explaining variation in beta diversity even when all sites were a priori thought to represent the same forest type. This indicates that the structural forest classifications need to be refined with floristic inventories to yield realistic estimates of beta diversity.

If plant community composition is at least partly deterministic, and different plant groups react to a common set of edaphic variables, then inventorying just a small part of the flora (indicator species or indicator plant groups, Ruokolainen et al. 1997) should give an indication of the overall floristic patterns of the forest. One consequence of such determinism would also be that species with known ecological preferences could be used to assess local edaphic conditions. In temperate and boreal areas, there is a long history of such a practice (Cajander 1926, Ellenberg 1988, Gégout et al. 2003, Wilson et al.

2001). The floristic pattern revealed by indicator groups can also work as a basis for optimising complementarity when planning conservation area networks (Faith & Walker 1996, Ferrier 2002).

In Amazonian forests, inventorying and identifying all plants is a daunting task. Most floristic inventories have been facilitated by excluding epiphytes, lianas, understorey plants and tree saplings, and instead concentrating on trees exceeding a predefined stem diameter, but it has also been suggested that easily spotted understorey plants could be used as indicators of general floristic and edaphic patterns (Ruokolainen et al. 1997). Higgins & Ruokolainen (2004) found that concentrating sampling efforts on a preselected taxon (genus or family) is more efficient in representing the floristic patterns of the full dataset than concentrating on a preselected size class. However, some studies have suggested that plants from different vegetation layers yield different classifications of field sites (McCune & Allen 1985, Oliver et al. 1998, Sagers & Lyon 1997, Webb et al. 1967).

Four earlier studies (Ruokolainen & Tuomisto 1998, Ruokolainen et al. 1997, Tuomisto et al. 1995, Vormisto et al. 2000) have reported high congruence between the floristic patterns (as measured with floristic distance matrices) of trees, Melastomataceae and pteridophytes. However, all these studies were conducted in a region famous for its heterogeneous soils, including white sands (Loreto department in northern Peru, Gentry 1988). In Colombian Amazonia, variation in tree species abundances was found to be



related to variables derived from the abundances of pteridophytes and Melastomataceae (Duque et al. 2005), but differences in analysis methods prevent direct comparison between the Colombian and Peruvian results. Therefore, it is not clear how general the congruence between plant groups is across regions.

The aim of the present paper is to test the reliability of indicator plant groups in inferring floristic and edaphic patterns in Amazonian rain forests using a larger data set than has been available before. To this effect, we first analyse to what degree different plant groups (trees, pteridophytes and Melastomataceae) produce congruent floristic patterns in Amazonian tierra firme forests of three separate regions. Then we analyse to what degree this congruence may be explained by edaphic differences and geographical distances.

## ***Materials and methods***

### **Study sites**

Field work was conducted in three regions of western Amazonian lowlands (Figure 4, Table 6): the departments of Madre de Dios (200–300 m elevation) and Loreto (100–200 m) in Peru, and the Yasuní National Park in Ecuador (200–300 m). The climate is clearly seasonal with a mean annual precipitation of 2300 mm in the Madre de Dios

region (Pitman et al. 2001) and aseasonal with a mean annual precipitation of about 3000 mm in the Loreto and Yasuní regions (Lips & Duivenvoorden 2001).

Seven sites were inventoried in Madre de Dios and Yasuní, and nine in Loreto. All sites were situated in old-growth closed-canopy tierra firme forest. The soils at all sites were clayey to loamy. Although forests on white-sand soils were found in Loreto, these were excluded from the present study because they can easily be recognised in the field by their physiognomy, and their floristic distinctness is already widely acknowledged. The Loreto sites have been used earlier in somewhat similar but less-comprehensive analyses than those of the present paper (Ruokolainen & Tuomisto 1998, Ruokolainen et al. 1997, Tuomisto et al. 1995).

## **Floristic inventories**

Three plant groups were inventoried at each site: trees, Melastomataceae and pteridophytes. Tree plots were placed such that recent tree-fall gaps were avoided. In Madre de Dios, trees  $\geq 10$  cm diameter at breast height (dbh) were inventoried in square 100 m  $\times$  100-m plots (1 ha) except in one case where the plot covered only 0.865 ha (Pitman et al. 2001). In Loreto, four 20 m  $\times$  20-m plots were established per site (totalling 0.16 ha), and local topographic variability was included by placing two plots on hill tops and two in valley bottoms (Ruokolainen & Tuomisto 1998, Ruokolainen et al. 1997). In

Yasuní, usually one (but sometimes two) 20 m × 50-m (0.1 ha) plot was established per site (Romero-Saltos et al. 2001). All tree individuals  $\geq 2.5$  cm dbh were inventoried in both Loreto and Yasuní.

Voucher specimens were collected of all tree individuals that could not be confidently identified to a species that had already been collected. The vouchers were identified to species, or if an applicable species name could not be found, assigned to morphospecies that were thought to correspond to biological species. Vouchers collected in the same region were cross-checked to get consistent identifications among sites. Duplicates of the vouchers collected in Madre de Dios are deposited in CUZ and DUKE, those collected in Loreto are in AMAZ, TUR and USM, and those collected in Yasuní are in AAU, MA, QCA and QCNE (herbarium acronyms according to Holmgren et al. 1990).

Melastomataceae and pteridophytes were inventoried at all sites using 5 m × 500-m line transects (Tuomisto et al. 2003a, c). In Madre de Dios, all transects shared a strip of 5 m × 100 m with their corresponding tree plot. In Loreto, the original transect line was usually 1300 m long, but only the first 500 m are used here. In one site, all four tree plots shared a strip of 5 m × 20 m with the transect, in most sites two tree plots did, and in two sites, one did. Each transect in Yasuní overlapped with a strip of 5 m × 50 m of the corresponding tree plot, except in three sites, where the transect extended between two tree plots.

All terrestrial Melastomataceae individuals with post-cotyledon leaves were recorded. All pteridophyte individuals with at least one green leaf longer than 10 cm were recorded, including epiphytes and climbers if they had such leaves less than 2 m above ground. Each rooting stem of vegetatively spreading species was counted as one individual. Voucher specimens were collected for each species in each region and for individuals that could not be confidently identified to an already vouchered species. Duplicates of the vouchers collected in Madre de Dios are deposited in CUZ, TUR and USM, those collected in Loreto are in AMAZ, TUR and USM, and those collected in Yasuní are in TUR, QCA and QCNE.

## **Soil sampling**

Surface soil samples (top 5 cm of the mineral soil) were collected from at least three points along each transect: near the beginning, middle and end. If the terrain was hilly, two samples were taken in hill tops, and one in a valley bottom. Each soil sample consisted of five pooled subsamples collected within an area of about 5 m × 5 m.

The soil samples were analysed for pH, exchangeable bases (Ca, K, Mg, Na, each separately), exchangeable aluminium, and loss on ignition at 420°C (LOI, a proxy for the content of organic matter). The analyses followed standard procedures (Ruokolainen & Tuomisto 1998, van Reeuwijk 1993). The soil samples from Madre de Dios and Yasuní

were analysed in the laboratory of the MTT Agrifood Research Finland. The samples from Loreto were analysed either in MTT, the International Soil Reference and Information Centre (ISRIC, The Netherlands) or the Geological Survey of Finland (GSF).

Soil texture was characterized by the percentage of the sand fraction of soil weight (particles 0.063-2 mm in diameter). All samples of Loreto and four of Yasuní were analysed by sieving after pretreatment with H<sub>2</sub>O<sub>2</sub> and citrate-dithionite-bicarbonate (MTT and ISRIC) or after ultrasonic dispersion (GSF). All samples from Madre de Dios and three from Yasuní were analysed in the laboratory of the Department of Geology, University of Turku, using a laser grain analyser after the same pretreatment as in GSF.

## **Computing of distance matrices**

Since tree taxonomy had not been harmonized among regions, distance matrices were computed independently for each of the three regions, and all analyses were run for each region separately. Floristic distance matrices were computed separately for trees, pteridophytes and Melastomataceae. The Sørensen index and the mathematically similar Steinhaus index were used for presence-absence and abundance data, respectively (Legendre & Legendre 1998). These similarities were converted to distances by subtracting them from one.

Separate distance matrices were computed for all trees, common trees and rare trees. Common trees were defined in two alternative ways: (1) the most common 150 species, or (2) the most common 20% of the species in each regional data set. All other species were considered rare. The primary measure of commonness was the number of stems, and the secondary measure was the number of plots in which the species was recorded. All species with the same abundance and the same frequency were allocated to the same commonness category, so the number of common species deviated slightly from the nominal limit in each region.

Three of the Yasuní sites possessed two paired tree plots. The tree distance matrices were initially computed using all plots separately. Afterwards, the matrix was trimmed to the correct number of sites by using the mean of the two resemblance values computed between a site with paired plots and another site. The alternative of averaging tree abundances before computing the distance values would have artificially decreased the distance values involving the paired plots, as the distance measures used here are sensitive to sample size (Wolda 1981).

Soil differences between plots were expressed in Euclidean distances computed separately for each soil variable. The concentrations of elements (Al, Ca, K, Mg and Na) were transformed to their natural logarithms before calculating the Euclidean distances in order to give more weight to a unit difference in concentration when the overall concentration was low than when it was high.

Geographical distances between sites were computed from latitude and longitude that were obtained either in the field with a hand-held GPS or estimated from a rectified satellite image. The geographical distances were transformed to their natural logarithms before analysis. All resemblance matrices were computed using the program Le Proiciel R (available at <http://www.bio.umontreal.ca/legendre/indexEnglish.html>).

### **Mantel tests and ordinations**

If environmental factors control species composition, floristic similarity should decrease monotonically with increasing environmental difference between sites, and floristic similarities of different plant groups should be correlated. If random dispersal and local extinctions are the main structuring forces, floristic similarity should decrease approximately linearly with increasing logarithm of geographical distance (Hubbell 2001, fig. 7.9) but should not be correlated with edaphic differences, and the floristic similarities of different plant groups should not be correlated beyond the geographical distance effect.

Mantel test of matrix correspondence was used to test whether distance matrices were correlated (Legendre & Legendre 1998). The standardised form of the Mantel statistic was used ( $r_M$ , similar to the Pearson correlation coefficient) and the statistical significance of each correlation was estimated by 999 permutations.

Mantel tests were run to quantify the correlations between plant groups, between each plant group and environmental distances, and between plant groups and log-transformed geographical distances. Partial Mantel tests were run to verify whether the floristic distance matrices remained correlated after the effect of geographical distances had been taken into account. In order to visualise the floristic patterns among the inventory sites, we ran Principal Coordinates Analysis (PCoA) using the floristic distance matrices of each plant group separately. Both Mantel tests and ordinations were run using the program Le Proiciel R.

It has been suggested that regions extending over thousands of square kilometres may be dominated by a set of ecologically generalist tree species (Macía & Svenning 2005, Pitman et al. 2001, Terborgh et al. 2002) that may be more indifferent to edaphic effects than rare tree species (Phillips et al. 2003a, Pitman et al. 2001), so we ran all analyses separately for common and rare trees.

## **Multiple regressions on distance matrices**

The relative contributions of soil differences and geographical distances to explaining the variation in each floristic distance matrix were quantified using multiple regression on distance matrices (Legendre et al. 1994) following the variation partitioning approach of Duivenvoorden et al. (2002). Separate analyses were run with



three combinations of independent matrices. (1) Eight edaphic variables. Each cation was used as a separate distance matrix, and variables that did not have a statistically significant ( $P < 0.1$  after Bonferroni correction) contribution to explaining the variation in the floristic distance matrix were excluded by backward elimination. If only one environmental variable remained, the variable that had shown the highest Mantel correlation with the floristic distance matrix was used. (2) log-transformed geographical distances (only retained for further analyses if  $P < 0.1$ ). (3) All independent variables retained in the first or second model.

The resulting percentages of explained variation in floristic distances,  $R^2(1)$  through  $R^2(3)$ , were used to compute the fractions a through d as follows: a = variation explained by edaphic differences alone =  $R^2(3) - R^2(2)$ ; b = variation explained by edaphic and geographical distances jointly =  $R^2(3) - R^2(2) - R^2(1)$ ; c = variation explained by geographical distances alone =  $R^2(3) - R^2(1)$ ; and d = variation explained by neither edaphic nor geographical distances (unexplained) =  $100\% - R^2(3)$ . With increasing correlation between the environmental and geographical distances, it becomes increasingly difficult to separate between their effects, which leads to a larger b fraction and smaller a and c fractions.

The program Permute! was used to run multiple regression on distance matrices (available at <http://www.bio.umontreal.ca/legendre/indexEnglish.html>).

## **Results**

### **Floristic inventories**

We inventoried 23 sites, including a total of 10,867 individuals of trees, 47,908 of pteridophytes, and 5915 of Melastomataceae (Table 6). Tree species outnumbered pteridophyte and Melastomataceae species by an average of 7-fold and 10-fold, respectively. There were obvious differences between regions in the number of species encountered. For trees this is partly due to differences in sampling methods. Each site contained, on average, 150–230 tree species, 33–55 pteridophyte species and 14–36 Melastomataceae species.

Compared to the huge differences among plant groups in the numbers of individuals and species, the differences in mean similarities between sites within a region were small. Generally, floristic similarity was higher between sites in Yasuní than in the other regions (Table 6), but again caution is needed: the relatively high similarity values for trees in Madre de Dios may be due to sampling differences.

### **Soils**

Soil analyses revealed marked differences in soil characteristics both among regions and among sites within regions (Table 7). All sites had acid soils: only three sites in Madre de Dios had soil pH higher than 4. Mean soil aluminium concentration was highest in Yasuní and lowest in Madre de Dios, whereas the concentrations of exchangeable bases were highest in Madre de Dios and lowest in Loreto.

Sites in Yasuní had more similar soils than sites in the two other regions, but on average, the finest-textured soils were found in Yasuní and the coarsest in Madre de Dios. In Loreto and Madre de Dios, among-site variation in soil Ca and Mg concentrations ranged over two orders of magnitude with standard deviations larger than the mean. In Yasuní, soil Ca and Mg concentrations varied within one order of magnitude with standard deviations clearly smaller than the mean (Table 7).

## **Congruence between plant groups**

Floristic patterns of all three plants groups, when measured with presence-absence data (Sørensen index), were found to be significantly correlated in all regions, with one exception (trees-Melastomes in Yasuní; Table 8). The highest Mantel correlation coefficients were obtained in Loreto ( $r_M \geq 0.82$  for all plant group pairs), and the lowest in Yasuní ( $r_M \leq 0.62$ ).

Floristic patterns of pteridophytes were always correlated with those of trees and Melastomataceae, even when the effect of geographical distances was removed through a partial Mantel test. Taking the geographical distances into account made almost no difference in Loreto and Yasuní. Floristic patterns of Melastomataceae correlated with those of trees in two regions (Madre de Dios and Loreto), but only the Loreto correlation was independent of geographical distances.

The correlation coefficients were generally lower when abundance data were used (Steinhaus index), and the incidence of non-significant correlations was higher than with presence-absence data (Table 8). Nevertheless, the floristic patterns based on abundance data of all three plant groups were correlated in Loreto, and these correlations were independent of geographical distances. The floristic patterns of pteridophytes were correlated with those of trees and Melastomataceae also in Madre de Dios, but only the latter correlation was independent of geographical distances. In Yasuní, none of the correlations was statistically significant.

The rare and common trees produced very similar Mantel test results in Madre de Dios and Loreto, but not in Yasuní where weaker correlations were obtained with rare trees than with common trees (Table 9). The correlations of both tree categories with pteridophytes were stronger than their correlations with Melastomataceae in Madre de Dios and Yasuní, but about the same in Loreto. The floristic patterns of common and rare trees were correlated with each other. These correlations were very similar to the

correlations that both groups of trees showed with pteridophytes (Table 9), and were lower than or similar to the correlations that all trees showed with pteridophytes (compare Tables 8 and 9). The results were qualitatively similar when common trees were defined as the top 150 species or the top 20% of species, so for the other analyses we report only the results for the top 150 species.

### **Congruence between floristic, environmental and geographic patterns**

Mantel test results between floristic and edaphic differences varied among soil variables, among regions and, to a lesser degree, among plant groups (Table 10). Calcium, magnesium and the sum of cations yielded high and statistically significant Mantel correlations with most floristic distance matrices in Madre de Dios and Loreto. The correlations involving pH or geographical distances were mostly significant in Madre de Dios but mostly not significant in the other regions, whereas a high incidence of significant correlations involving Al, K or sand content was typical of Loreto. In Yasuní, only Mantel correlations involving sand, pH and Mg ever reached statistical significance. Loss on ignition did not correlate significantly with any of the floristic differences in any region, and Na only did once in Madre de Dios.

Although the Mantel test results obtained with the three plant groups and the two floristic distance measures were far from identical, they usually gave the same idea

of which edaphic variables were important for explaining the variation in floristic differences in each region. Table 10 shows 27 cases where floristic variation is related to edaphic variation (nine edaphic variables in three regions). If the division between common and rare trees is ignored for the moment, in 24 of the 27 cases either all six floristic distance matrices agreed on whether the Mantel correlation with a given edaphic distance matrix was significant or not, or just one of them gave a different result. Considering the common and rare trees separately brings this congruence between plant groups down to 20 out of 27 cases, but there is no tendency in whether it is the rare or the common trees that yield higher Mantel correlations.

Within each region, the same edaphic variables tended to yield high Mantel correlation with all floristic distance matrices. The highest correlations were obtained with Ca and Mg concentration in Madre de Dios and Ca concentration and sum of cations in Loreto. In Yasuní, soil sand content yielded the highest correlations in most cases, and the differences were very small when pH or Al concentration yielded higher Mantel correlations. Rare trees in Yasuní deviated from the general pattern, as they yielded the highest Mantel correlations with LOI.

The ordinations obtained with the three plant groups were congruent in all three regions (Figure 5). In Madre de Dios, the sample plots in the western part of the study area, where soil cation concentrations were highest, were floristically more similar to each other than to the plots further to the east. In Loreto, the floristic ordinations

separated between the sample plots with high soil cation concentration and those with low soil cation concentration, even though the poor-soil sites were spread over long geographical distances. In Yasuní, the ordinations based on trees and pteridophytes showed that the site with the highest soil cation concentration (Tiputini 8) was floristically different from the other sites, irrespective of geographical distance. For the Melastomataceae, geographical proximity seemed to be more important, as Tiputini 8 appeared floristically rather similar to the plot that was geographically closest to it but with poorer soils (Tiputini 9).

The amount of variation in floristic distances that could be explained in the variation partitioning models differed markedly among the three regions (Figure 6). The proportion of explained variation was generally highest in Madre de Dios (50–86%, mean = 71%), next highest in Loreto (30–57%, mean = 47%) and lowest in Yasuní (14–74%, mean = 41%). The explained variation in Sørensen distances was usually higher than that explained in Steinhaus distances of the same plant group.

Edaphic difference always contributed to explaining floristic differences (statistically significant multiple regression result, and a non-zero a fraction), no matter which region and which plant group was analysed. In contrast, geographical distances made a statistically significant contribution in less than two-thirds of the analyses, and the c fraction was in most cases smaller than the a fraction. A spatial structure in both

the edaphic and the floristic data was most evident in Madre de Dios, where fraction b (jointly explained by edaphic and geographical distances) was usually large (Figure 6).

At least one of the exchangeable bases Ca, K and Mg (most commonly Ca) was retained in all the multiple regression models in Madre de Dios and Loreto, and in four of the ten models in Yasuní. In addition, Al was often retained in Madre de Dios, LOI in Loreto and sand in Yasuní (Figure 6).

In Madre de Dios and Loreto, the total proportion of explained variation in floristic differences was relatively similar for common and rare trees. However, the unique contribution of edaphic differences was clearly larger for common trees than for rare trees, whereas the unique contribution of geographical distances was larger for rare trees than for common trees. In Yasuní, the proportion of explained variation was clearly higher for common trees than for rare trees (Figure 6).

## ***Discussion***

### **Determinants of floristic patterns**

The Mantel correlations between pteridophytes and all trees varied between 0.54 and 0.82 (presence-absence data), which means that 29–67% of the variation in the beta diversity of trees can be modelled with a simple linear function of the beta diversity of



pteridophytes. In the multiple regression models, 22–80% of the variation in the beta diversity of all trees was explained by edaphic differences, 0–64% by geographical distances, and 49–86% by the two combined. These can be considered high percentages, given that all study sites represented structurally similar forests that are generally thought to belong to the same forest type.

The floristic predictability that these results imply seems to arise from similar responses of the different plant groups to edaphic variability; usually the same edaphic factors emerged with high Mantel correlation coefficients no matter which of the three plant groups was analysed.

The relationships between plant groups and environmental properties become noisier as the length of the observed environmental gradient decreases (Ruokolainen et al. 1997). This probably explains the observed differences among our study regions. Soil properties varied least in Yasuní and most in Loreto. Accordingly, the floristic differences among sites were smaller, the Mantel correlations between plant groups lower, and the role of edaphic differences in explaining floristic patterns smaller in Yasuní than in Madre de Dios and especially Loreto.

Geographical distances were most important in Madre de Dios, where the edaphic characteristics themselves were spatially autocorrelated. In Loreto and Yasuní, where geographical proximity was a less reliable predictor of edaphic similarity, geographical distances contributed less to explaining floristic differences.

We found that soil differences played a more important role than geographical distances in explaining floristic patterns, which agrees with several recent studies (Phillips et al. 2003a, Potts et al. 2002, Tuomisto et al. 2003a, b, c). However, Vormisto et al. (2004) found that geographical distances were more important, which might be due to differences among the focal plant groups or the studied geographical regions, or the fact that Vormisto et al. had not measured all the soil variables that were found significant in the other studies.

On average, the variation in floristic differences of all trees was explainable to a higher degree (62%) than that of either pteridophytes (57%) or Melastomataceae (37%). This suggests, in accordance with Svenning et al. (2004), that beta diversity of trees is no less dependent on spatial and edaphic factors than beta diversity of the smaller-statured plant groups. The differences between plant groups may even reflect the relatively small number of sites in our study: In a larger data set, little difference was found between Melastomataceae and pteridophytes (Tuomisto et al. 2003c).

The Mantel tests and multiple regression analyses showed that the within-region floristic differences of common trees were at least as well explainable by edaphic differences as the floristic patterns of rare trees. This agrees with Phillips et al. (2003a) in that even if common trees are competitively superior and able to dominate the forest in some circumstances (Pitman et al. 2001), they are not indifferent to environmental heterogeneity.

## **Are these results reliable?**

Our data set has five evident sources of error, which all bias the results towards underestimating the correspondence between edaphic and floristic patterns. (1) The tree plots overlapped only partly with the line transects data. (2) Many environmental variables known to affect plant growth were not measured (e.g. light availability, soil drainage and soil nitrogen). (3) Only three soil samples were taken at each site, only the surface soil was sampled, and all samples were taken on a single occasion. (4) Standard laboratory protocols may not give an optimal representation of soil properties at the root surface. (5) The soil samples from Loreto were analysed in three different laboratories, which led to measurement error.

A larger data set might have yielded stronger relationships between the floristic and edaphic patterns, as small data sets are error-prone and only very clear patterns can yield statistically significant results. In a 27-site study in Yasuní, we covered the local soil gradient better than in this study and indeed found stronger relationships between Melastomataceae, pteridophytes and soils (Tuomisto et al. 2003a).

The Mantel correlations between plant groups may be affected by the number of species per group. For the very species-rich trees, the plots are too small to contain a representative sample of the local flora, but species-poor groups may reflect the edaphic

patterns incompletely (Higgins & Ruokolainen 2004). This may partly explain why beta diversity of trees was more closely correlated with beta diversity of pteridophytes than that of Melastomataceae in Madre de Dios and Yasuní, where pteridophytes were clearly more species-rich than Melastomataceae. It is actually surprising that Melastomataceae can give a fair idea of the floristic patterns of trees in Madre de Dios, where the average site has only 14 Melastomataceae species but 159 tree species. This result can hardly be explained unless the same external factors control species distributions in both plant groups.

Despite differences among the three regions in the tree plot area and diameter class limits, the total number of stems sampled per region and the average number of stems per site were rather similar. Because increasing the number of stems in diameter-class inventories seems to yield better representation of general floristic patterns whatever the size of the stems (Higgins & Ruokolainen 2004), we consider the tree plots comparable for the purposes of the present study. If plant size is negatively correlated with the degree of ecological specialisation (cf. Duque et al. 2002, Ruokolainen & Vormisto 2000, Ruokolainen et al. 2002), the correlation coefficients obtained for trees may be biased downwards in Madre de Dios, where only large trees were sampled, but even there the proportion of variation explainable with edaphic differences was comparable for the three plant groups.

In general, the floristic patterns of trees, pteridophytes and Melastomataceae were more strongly correlated when presence-absence than abundance data were used. This difference is probably due to sampling error: reliable measurement of the abundance of a species at a site necessitates inventorying a larger surface area than reliable estimation of whether the species is present.

### **Practical implications**

Our results are in agreement with the suggestion that edaphic heterogeneity plays an important role in promoting beta diversity in Amazonian terra firme forests, and that floristic patterns are sufficiently strongly linked to edaphic patterns to be considered both predictable and relatively stable in time. Consequently, classifying these forests to edaphically defined site types, which also reflect floristic variation, appears both realistic and useful.

The information on habitat heterogeneity within terra firme forests needs to become more detailed to allow evaluating how well existing protected area networks achieve complementarity, and where areas representing habitats not yet included in protected areas are situated. Such information also helps in evaluating to where results from field studies can be extended, as interpolation within the same forest type is less risky than extrapolation to a different type. Because inventories including all plant

species are laborious, it will be a great advantage if reliable maps on floristic patterns can be based on surrogates, such as easily observable indicator plant groups in combination with environmental and remotely sensed data (Faith & Walker 1996, Ferrier 2002, Salovaara et al. 2005, Thessler et al. 2005, Tuomisto et al. 1995, 2003a, b). Mapping floristic patterns in Amazonian tierra firme forests over hundreds of thousands of square kilometres is hardly realistic if ground-truthing is based on inventories of trees or all plants. In our experience, both field inventories and species identifications of pteridophytes and Melastomataceae are at least an order of magnitude faster than those of trees (see also Higgins & Ruokolainen 2004, Phillips et al. 2003b).

The congruence among plant groups in our study was far from perfect, but when the tree data were divided into two subsets (common trees and rare trees), the Mantel correlations between these were similar to the correlations between either tree subset and pteridophytes. This indicates that pteridophytes provide as accurate a picture of floristic patterns in trees as do subsets of the trees themselves. We find that these results warrant recommending the use of indicator groups for general habitat mapping and analyses of heterogeneity and distinctiveness, as promoted by Faith & Walker (1996) and Ferrier (2002).

The indicator groups obviously cannot provide direct information on non-inventoried taxa. So even if the modelling of beta diversity and consequent habitat mapping were based on indicator species, inventories of trees and other plants should

still be conducted at a subset of the field sites both to obtain direct data on their distributions, and to verify to what degree they conform with the floristic patterns of the indicators. The indicator groups can help in stratifying the sampling for these more time-consuming studies, which in turn can be used iteratively to refine the initial models (Ferrier 2002).

It can be argued that forest types could be separated on the basis of soil data, and indicator species would hence not be needed (Duque et al. 2005). However, soil mapping at a sufficient spatial resolution would necessitate collecting and analysing very large numbers of soil samples. The number and cost of soil samples increase in direct proportion to the size of the area of interest, and the data would only be available after laboratory analyses. In contrast, a list of indicator species occurring at a site can be obtained quite rapidly, and is immediately available for use. Indicator plant groups may also help in weighting the importance of environmental variables, indicate effects of such environmental variables that are difficult or impossible to measure from soil samples, and reveal biogeographical differences in regional species pools which are indispensable for conservation purposes (cf. Faith & Walker 1996, Ferrier 2002, Tuomisto et al. 2003c).

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**Table 6: Results of floristic inventories made in three regions in lowland western Amazonia. Floristic similarity between sites is calculated both with the Steinhaus index (Steinh.) (abundance data) and with the Sørensen index (Søren.) (presence-absence data).**

Plant group	Area (ha) sampled per site (per region)	Total number of species	Mean number of species per site (range)	Total number of individuals	Mean number of individuals per site (range)	Similarity between sites (mean $\pm$ SD)	
						Steinh.	Søren.
Madre de Dios							
Trees	1.0 <sup>1</sup> (6.875)	479	159 (134–183)	3886	555 (498–609)	0.31 $\pm$ 0.09	0.40 $\pm$ 0.06
Pteridophytes	0.25 (1.75)	105	35 (23–53)	13539	1934 (668–4488)	0.21 $\pm$ 0.18	0.35 $\pm$ 0.17
Melastomataceae	0.25 (1.75)	58	14 (5–27)	789	113 (9–374)	0.11 $\pm$ 0.12	0.21 $\pm$ 0.14
Loreto							
Trees	0.16 (1.44)	1158	228 (201–271)	3884	432 (354–543)	0.18 $\pm$ 0.07	0.21 $\pm$ 0.07
Pterid.	0.25 (2.25)	101	33 (22–41)	16901	1878 (916–4178)	0.17 $\pm$ 0.14	0.44 $\pm$ 0.12
Melast.	0.25 (2.25)	96	27 (15–38)	3356	373 (130–984)	0.18 $\pm$ 0.17	0.30 $\pm$ 0.18
Yasuní							
Trees	0.1 (1.0)	655	152 (130–179)	3097	310 (240–380)	0.25 $\pm$ 0.05	0.31 $\pm$ 0.05
Pterid.	0.25 (1.75)	111	55 (43–64)	17468	2495 (1094–4842)	0.33 $\pm$ 0.11	0.63 $\pm$ 0.10
Melast.	0.25 (1.75)	87	36 (26–46)	1770	253 (168–342)	0.32 $\pm$ 0.13	0.53 $\pm$ 0.09

<sup>1</sup>At one site the plot was 0.875 ha.

**Table 7 : Results of chemical and physical analyses of soils within three regions in lowland western Amazonia. Cation concentrations are given in cmol(+) kg-1, LOI (loss on ignition) and sand content in %.**

	Madre de Dios		Loreto		Yasuni	
	Mean $\pm$ SD	Range	Mean $\pm$ SD	Range	Mean $\pm$ SD	Range
Al	1.69 $\pm$ 1.46	0.30–4.75	5.67 $\pm$ 2.36	2.80–9.00	9.91 $\pm$ 3.71	3.77–14.37
Ca	4.52 $\pm$ 5.39	0.05–11.68	1.22 $\pm$ 2.08	0.02–6.17	3.52 $\pm$ 2.41	1.54–8.68
K	0.23 $\pm$ 0.11	0.12–0.38	0.12 $\pm$ 0.06	0.05–0.21	0.21 $\pm$ 0.04	0.16–0.25
Mg	0.92 $\pm$ 0.98	0.08–2.44	0.27 $\pm$ 0.36	0.05–1.15	1.25 $\pm$ 0.41	0.97–2.14
Na	0.02 $\pm$ 0.01	0.01–0.03	0.02 $\pm$ 0.01	0.01–0.05	0.04 $\pm$ 0.01	0.02–0.06
pH	4.09 $\pm$ 0.65	3.52–5.11	3.82 $\pm$ 0.14	3.58–3.98	3.59 $\pm$ 0.16	3.39–3.86
LOI	4.0 $\pm$ 0.8	3.0–4.9	6.2 $\pm$ 1.2	4.6–8.1	8.6 $\pm$ 1.5	6.9–11.5
Sand	52 $\pm$ 29	19–90	70 $\pm$ 23	33–97	82 $\pm$ 11	59–91

**Table 8: Mantel correlations between floristic differences based on three different plant groups in three western Amazonian regions. Partial Mantel tests, where the effect of geographical distances has been removed before computing the correlation between the two floristic distance matrices, are shown in parenthesis. Sørensen index uses species presence-absence data, Steinhaus index abundance data. Statistical significances were obtained by a Monte Carlo permutation test using 999 permutations: \*\*\* P < 0.001, \*\* P < 0.01; \* P < 0.05. The probability of obtaining a significant correlation coefficient by chance at the P < 0.05 level is 1 out of 20 tests, i.e. clearly lower than found here.**

	Trees – pteridophytes	Trees – Melastomataceae	Pteridophytes – Melastomataceae
Madre de Dios			
Sorensen	0.72** (0.56*)	0.49* (0.24)	0.59** (0.46*)
Steinhaus	0.47* (-0.01)	0.07 (-0.17)	0.62** (0.61**)
Loreto			
Sorensen	0.82*** (0.81***)	0.86*** (0.85***)	0.86*** (0.85***)
Steinhaus	0.77*** (0.76***)	0.78*** (0.77***)	0.74*** (0.73***)
Yasuní			
Sorensen	0.54* (0.55*)	0.32 (0.21)	0.62* (0.62*)
Steinhaus	0.28 (0.24)	0.21 (0.07)	0.47 (0.45)

**Table 9: Mantel correlations between floristic differences based on different plant groups in three western Amazonian regions. The Sørensen index (presence-absence data) was used in all cases. Statistical significances were obtained by a Monte Carlo permutation test using 999 permutations: \*\*\* P < 0.001, \*\* P < 0.01; \* P < 0.05. The probability of obtaining a significant correlation coefficient by chance at the P < 0.05 level is 1 out of 20 tests, i.e. clearly lower than found here.**

Tree group	Mantel correlation with		
	Rare trees	Pteridophytes	Melastomataceae
Madre de Dios			
Common trees (147 spp.)	0.63*	0.65*	0.43*
Common trees (20%)	0.68*	0.64*	0.32
Rare trees (332 spp.)	–	0.64**	0.44*
Rare trees (80%)	–	0.65**	0.52*
Loreto			
Common trees (157 spp.)	0.84***	0.79***	0.83***
Common trees (20%)	0.83***	0.80***	0.84***
Rare trees (1001 spp.)	–	0.82***	0.85***
Rare trees (80%)	–	0.81***	0.84***
Yasuní			
Common trees (152 spp.)	0.36*	0.49*	0.37
Common trees (20%)	0.39*	0.54*	0.36
Rare trees (503 spp.)	–	0.27	0.16
Rare trees (80%)	–	0.22	0.34

**Table 10: Mantel correlations between floristic differences and either edaphic or geographical distances in three regions of lowland western Amazonia. Three different plant groups were analysed separately using either the Steinhaus index (St; abundance data) or the Sørensen index (Sø; presence-absence data). LOI = loss on ignition. Edaphic differences were based on the Euclidean distance. The highest correlation coefficient of an edaphic variable for each region is shown in bold. Statistical significance of each correlation coefficient was assessed with a Monte Carlo permutation test using 999 permutations. \*\*\* P < 0.001, \*\* P < 0.01, \* P < 0.05, ° P < 0.1 (the last probability level is indicated to facilitate comparison with Fig. 3). The probability of obtaining a significant correlation coefficient by chance at the P < 0.05 level is 1 out of 20 tests, i.e. clearly lower than found here.**

Soil variable	All trees		Common trees		Rare trees		Pteridophytes		Melastomataceae	
	St	Sø	St	Sø	St	Sø	St	Sø	St	Sø
<b>Madre de Dios</b>										
Al	-0.01	0.30°	-0.03	0.31*	-0.01	0.03	0.32°	0.34°	0.47***	0.66***
Ca	<b>0.53*</b>	<b>0.74*</b>	<b>0.52*</b>	<b>0.72*</b>	<b>0.50*</b>	<b>0.48*</b>	<b>0.80**</b>	<b>0.88**</b>	0.58**	0.58*
K	0.01	0.28°	0.00	0.35°	0.10	0.00	0.49°	0.41°	0.50*	0.34°
Mg	0.32	0.55*	0.30	0.54*	0.32°	0.29°	0.70**	0.79**	<b>0.66**</b>	<b>0.67**</b>
Na	0.02	0.25	0.01	0.32°	0.13	0.03	0.56*	0.45°	0.43°	0.30°
Sum cations	0.40°	0.66*	0.39°	0.65*	0.42*	0.39°	0.77**	0.81**	0.63**	0.60**
LOI	0.26	0.06	0.25	-0.03	0.27	0.23	0.09	0.17	-0.08	0.00
pH	0.20	0.45*	0.18	0.41*	0.26	0.28	0.60*	0.71*	0.48**	0.53**
Sand	0.04	0.10	0.03	0.07	0.14	0.11	0.07	0.00	0.10	0.05
Geographical distance	0.76**	0.79**	0.72*	0.70*	0.81***	0.80***	0.62*	0.54**	0.24	0.45*
<b> Loreto</b>										
Al	0.42*	0.43*	0.42*	0.46*	0.46*	0.43*	0.34*	0.39*	0.25°	0.38*
Ca	0.63**	0.65***	0.62**	0.65**	<b>0.58**</b>	<b>0.59**</b>	<b>0.52**</b>	<b>0.70**</b>	0.44*	<b>0.68**</b>
K	0.61**	0.63**	0.60*	0.62*	0.60**	0.57**	0.50**	0.41*	0.36*	0.50*
Mg	0.49*	0.51**	0.48*	0.50**	0.41*	0.40*	0.33*	0.31°	0.27°	0.35*
Na	0.04	0.07	-0.01	0.04	0.13	0.12	-0.07	0.13	-0.17	0.01
Sum cations	<b>0.64**</b>	<b>0.66**</b>	<b>0.63**</b>	<b>0.66**</b>	0.55**	0.56**	0.49**	0.61**	<b>0.45*</b>	0.60**
LOI	0.25°	0.26°	0.23°	0.26°	0.25°	0.21°	0.24°	0.08	0.10	0.09
pH	0.24°	0.28°	0.20°	0.27°	0.32*	0.31*	0.36*	0.13	0.14	0.18
Sand	0.39*	0.40*	0.41*	0.41*	0.43*	0.41*	0.28*	0.52**	0.24°	0.48*
Geographical distance	0.21	0.20	0.18	0.15	0.39*	0.34*	0.23°	0.31*	0.21°	0.28*
<b> Yasuní</b>										
Al	0.35	<b>0.47°</b>	0.27	0.31	0.27°	0.26°	0.03	0.56	0.39°	0.16
Ca	0.10	0.20	0.04	0.09	0.22	0.18	0.19	0.56	0.30	0.24
K	0.00	0.08	-0.01	0.07	0.18	0.18	-0.26	-0.19	-0.09	-0.25
Mg	0.35	0.42°	0.30	0.32	0.22	0.19	0.22	0.73*	0.33°	0.26
Na	-0.22	-0.11	-0.23	-0.04	0.22	0.25°	0.02	0.02	0.02	0.20
Sum cations	0.17	0.26	0.12	0.15	0.21	0.17	0.22	0.61	0.30	0.24
LOI	0.18	0.26	0.13	0.28	<b>0.28°</b>	<b>0.28°</b>	-0.23	-0.10	-0.11	-0.11
pH	<b>0.38°</b>	0.44*	<b>0.35°</b>	0.38°	0.26	0.24	0.11	0.29	0.05	-0.01
Sand	<b>0.38</b>	0.46°	<b>0.33</b>	<b>0.39</b>	0.22	0.20	<b>0.38°</b>	<b>0.80*</b>	<b>0.40*</b>	<b>0.37</b>
Geographical distance	0.50*	0.49*	0.51*	0.57**	0.16	0.13	0.14	0.13	0.30	0.31

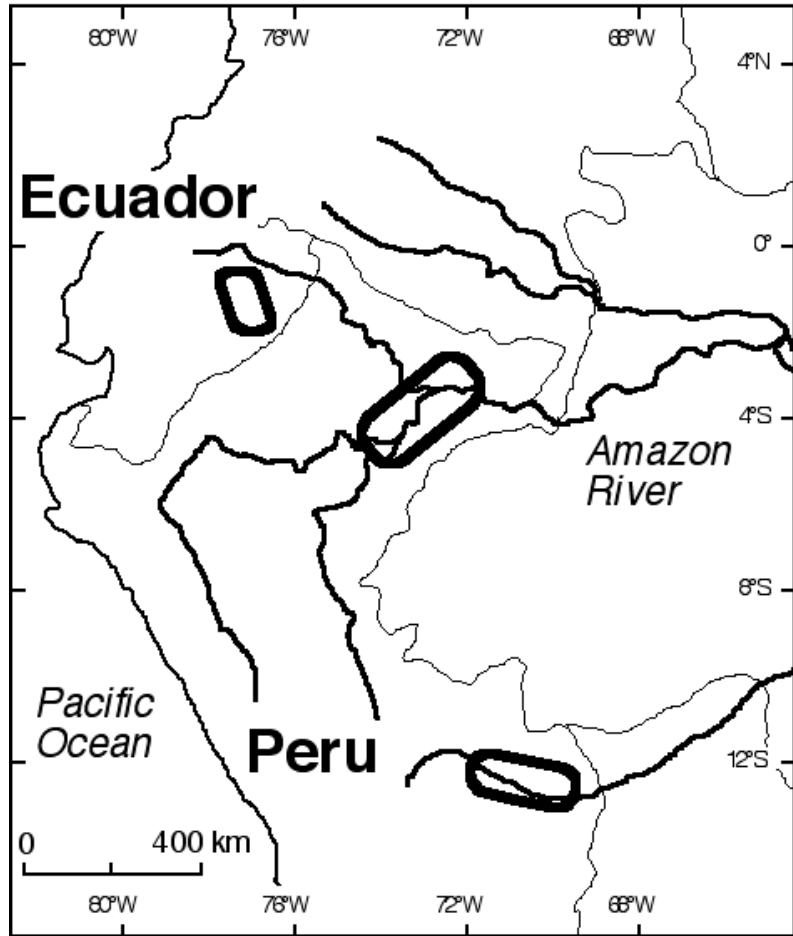
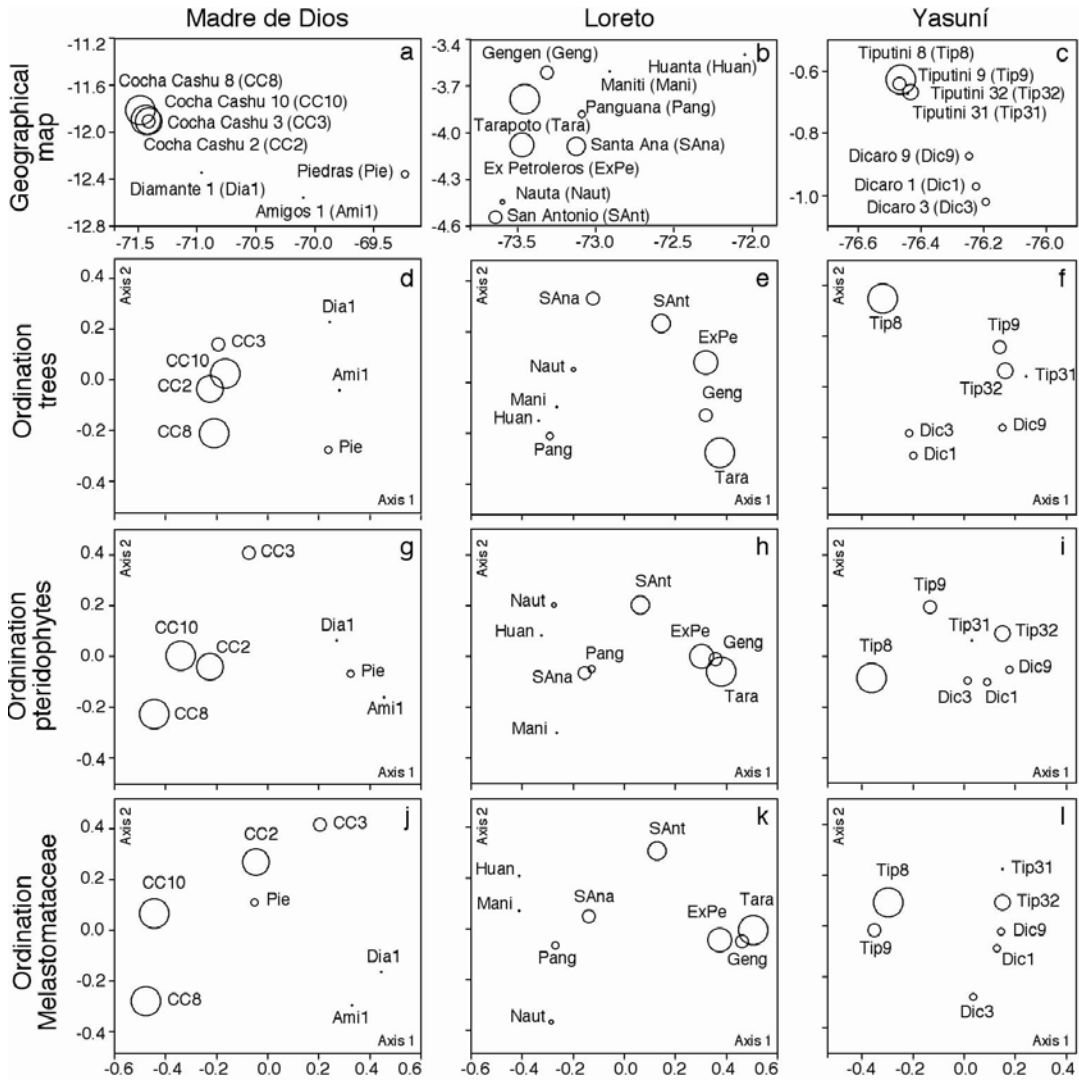
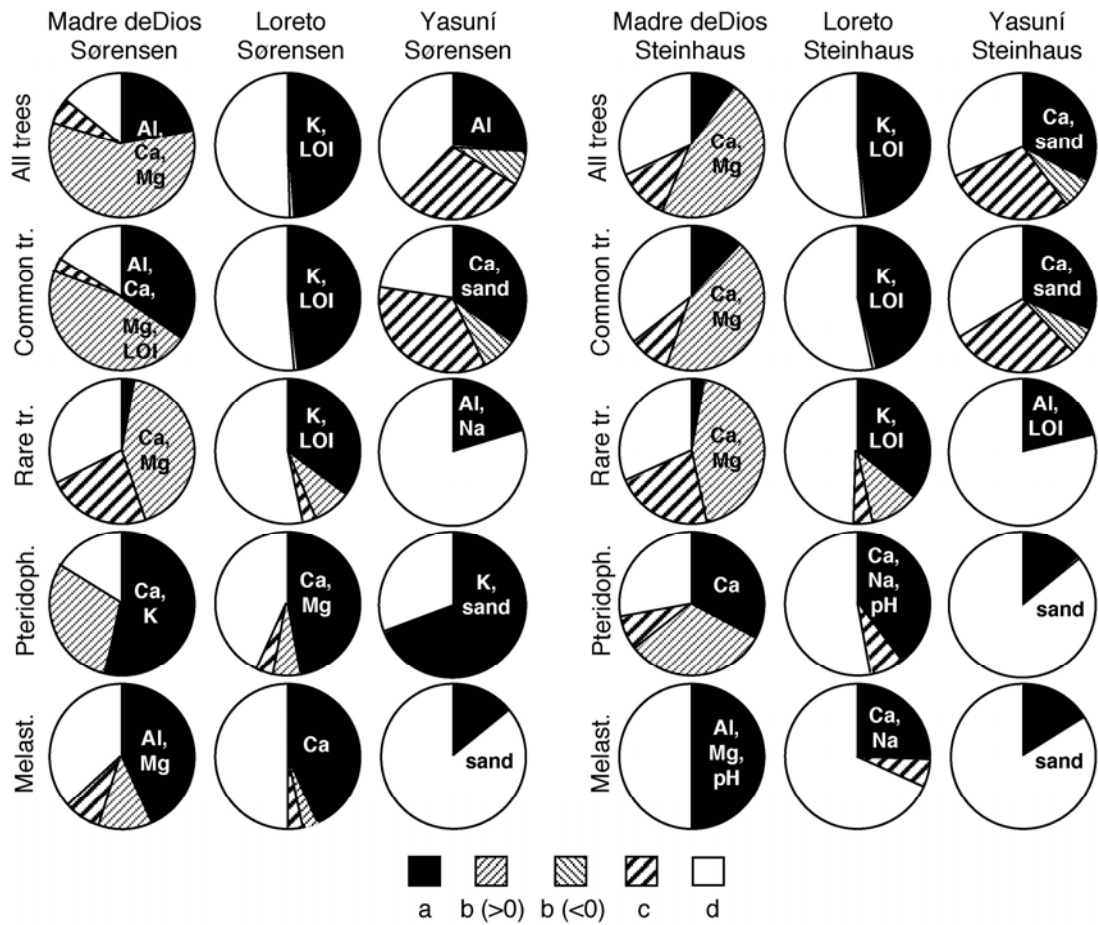


Figure 4: Map of the study area. Circled areas indicate the approximate locations of the three study regions: Yasuní (in Ecuador), Loreto (northern Peru) and Madre de Dios (southern Peru).



**Figure 5: Geographical locations of the study sites within each of three study regions (a, Madre de Dios; b, Loreto; c, Yasuní; latitude and longitude indicated in degrees), and floristic ordinations (Principal Coordinates analysis based on the Sørensen index) as obtained for each of three plant groups separately (d-f, trees; g-i, pteridophytes; j-l, Melastomataceae). The diameter of the circles is proportional to the mean concentration of exchangeable bases (Ca + K + Mg + Na) in the corresponding site relative to that in the other sites in the same region. The cumulative eigenvalues of the first two axes in the ordinations were 41-76%. For the location of the three regions, see Figure 4.**





**Figure 6: Results of variation partitioning of floristic differences (as based on multiple regression on distance matrices) in three regions of lowland western Amazonia. Trees (tr.), Pteridophytes (Pteridoph.) and Melastomataceae (Melast.) were analysed separately using either the Sørensen index (presence-absence data, left) or the Steinhaus index (abundance data, right). Edaphic differences were based on the Euclidean distance. The soil variables retained in a backward elimination procedure, and hence included in the final analysis, are shown in each case (LOI = loss on ignition). Proportions of variation explained: a = uniquely explained by the edaphic differences; b = jointly explained by the edaphic and geographical distances; c = uniquely explained by the geographical distances; d = unexplained. Since fraction b is obtained by subtraction, it may be either positive or negative.**

## Chapter 4: Long-term Sub-Andean Tectonics Control Floristic Composition in Amazonian Forests

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### **Summary**

Considerable debate exists about large-scale biological patterns and their determinants in Amazonian forests. Geological formations have been suggested to be responsible for floristic patterns in Amazonia, via variations in soil properties, but the large-area, densely-sampled datasets needed to study this relationship have been lacking. It is widely assumed that soils in western Amazonia are geologically more recent and therefore more fertile than those further east, and that this explains the observed west-east gradient in plant family and genus composition across Amazonia.

This explanation is at odds, however, with geological findings that widespread sediments in western Amazonia (e.g. the Pebas Formation) predate those in central Amazonia (e.g. the Içá Formation). Here we test the hypothesis that geological formations control floristic composition in Amazonian forests and document the scale at which this occurs. To do this we combined newly-available Landsat (Geocover) and elevation (Shuttle Radar Topography Mission, SRTM) datasets, with plant and soil data obtained from 138 remote and previously unexplored sites in northwestern Amazonia. We document an at least 300-km-long discontinuity in plant species composition, coincident with a 15-fold difference in soil cation availability and an erosion-generated boundary between two widespread geological formations. We further demonstrate, using continent-scale Landsat and SRTM mosaics, that similar processes have generated a geological and floristic discontinuity of at least 1,500 km in western Brazil, defining a chemical and ecological boundary between western and central Amazonia. Our findings suggest that Amazonian forests do not change gradually over large distances, but instead are partitioned into discrete large-area units on the basis of geological formations and their soils; and that soil properties are primarily controlled not by the age of formations but by a complex depositional and erosional history dating at least to the Miocene and driven by sub-Andean tectonics. These results emphasize the importance of integrating geological and biological information in studies of Amazonian

forests, and indicate that conservation and management strategies should be implemented on a region-by-region basis.

## ***Introduction***

Amazonian forests are globally important because of their role in international nature conservation and carbon sequestration efforts. Amazonia contains the largest remaining tracts of undisturbed tropical forest on earth, stores and processes globally significant amounts of carbon (Malhi et al. 2008, Phillips et al. 2009), and harbors record numbers of plant and animal species (Gentry 1988, Valencia et al. 1994). Amazonian forests are also the object of considerable economic interest in the form of oil exploration, timber extraction, agribusiness, and colonization (Soares et al. 2006, Oliveira et al. 2007, Finer et al. 2008, Finer and Orta-Martinez 2010). Reconciling conflicting interests in this area will require accurate and high-resolution maps of compositional and functional patterns (Dinerstein et al. 1995, Margules and Pressey 2000), and an understanding of the factors that control them.

Evidence is accumulating that edaphic variation between geological formations controls plant species composition and forest function in Amazonian forests (Tuomisto et al. 1995, Tuomisto et al. 2003c, ter Steege et al. 2006). This hypothesis has been difficult to test, however, due to a lack of geological, edaphic, and floristic data for these vast and

remote forests. It has long been thought that soils in western Amazonia are geologically more recent, and therefore less weathered and more fertile, than those further east (Irion 1984). This has been proposed as the explanation for an observed west-east gradient across Amazonia in plant family and genus composition (ter Steege et al. 2000, ter Steege et al. 2006, Pitman et al. 2008). Geological studies, however, have found that widespread sediments in western Amazonia (i.e. the Pebas Formation) predate those in central Amazonia (i.e. the Içá Formation) by millions of years (Räsänen et al. 1990, Rossetti et al. 2005). Estimates of heterogeneity in western Amazonia, furthermore, vary from relative uniformity over more than one thousand kilometers (Pitman et al. 2001, Condit et al. 2002, Macia and Svenning 2005), to edaphic and floristic mosaicism over tens or hundreds of kilometers (Tuomisto et al. 1995, Phillips et al. 2003a, Tuomisto et al. 2003a, Tuomisto et al. 2003b, Tuomisto et al. 2003c, Salovaara et al. 2004). These uncertainties have profound consequences for conservation planning and carbon management, and emphasize the need for further studies of the relationship between geology, soils, and plant species composition in Amazonia.

Edaphic patterns in western Amazonia reflect a complex history of deposition and erosion, dating to the Miocene and driven by the Andean orogeny. Early stages of the Andean uplift, during the early to middle Miocene (c. 25 to 12 mya), caused the formation of the Pebas embayment and the deposition of the Pebas Formation (equivalent to the Brazilian Solimões Formation). The Pebas Formation is distributed

across western and central Amazonia, and consists of poorly-weathered and cation-rich clay sediments deposited under low-energy semi-marine or lacustrine conditions (Hoorn 1994, Räsänen et al. 1995, Wesselingh et al. 2002). Continued Andean uplift during the Late Miocene-Pleistocene (c. 12-recent mya) caused the draining of this embayment and the transition to an environment dominated by continental fluvial or deltaic deposition (Räsänen et al. 1987, Räsänen et al. 1990, Figueiredo et al. 2009). During these high-energy conditions, the Pebas Formation was overlain by sandy, easily-weathered, and cation-poor sediments, such as the Nauta formation in Peru and the Içá Formation in central Amazonia (Schobbenhaus et al. 2004, Rebata et al. 2006). Further uplift during the Plio-Holocene (c. 5-recent mya) has forced drainage incision along the Andean foreland, replacing deposition with erosion (Räsänen et al. 1990). This has removed these more friable and cation-poor Late Miocene-Pleistocene deposits across much of western Amazonia, and thus exposed vast expanses of the buried, cation-rich Pebas Formation (Räsänen et al. 1990, INGEMMET 2000, Roddaz et al. 2005).

These processes have generated two types of pattern in western and central Amazonia. First, due to the uneven nature of Plio-Holocene uplift and drainage incision, islands of cation-poor Late Miocene-Pleistocene fluvial deposits remain across western Amazonia, elevated above the cation-rich Miocene Pebas matrix (Räsänen et al. 1990, INGEMMET 2000). These include the Nauta Formation in northern Peru (INGEMMET 2000, Rebata et al. 2006), and mesa-like islands of elevated, cation-poor soils along the

Napo and Curaray rivers (INGEMMET 2000, Tuomisto et al. 2003b), Higgins et al. in preparation). Second, the original Late Miocene-Pleistocene deposurface remains undisturbed in central Amazonia, where it is represented by the widespread Içá Formation (Schobbenhaus et al. 2004); though see Rossetti (Rossetti et al. 2005) for subdivisions of the Içá Formation). Geological studies suggest that the Pebas and Içá Formations meet in western Brazil (Räsänen et al. 1990, Schobbenhaus et al. 2004), and this may represent an edaphic limit between western and central Amazonia (Sombroek 1991).

Here we test the hypothesis that these uplift-generated erosional and edaphic patterns have been translated into patterns in floristic composition. To address the longstanding challenge of lack of data for these forests, we use a novel combination of newly-available Landsat Geocover satellite imagery (Tucker et al. 2004), SRTM (Shuttle Radar Topography Mission) digital elevation data (Rodriguez et al. 2006), taxa-based plant inventory, and soil sampling. Landsat imagery can be used to identify patterns in plant species composition (Tuomisto et al. 1995, Tuomisto et al. 2003a, Tuomisto et al. 2003b, Salovaara et al. 2005, Thessler et al. 2005) and SRTM data to identify geological formations (Rossetti and Valeriano 2007). Matched patterns in these data might thus be used to identify geologically-derived floristic patterns. We additionally focused our field data collection upon easily-observed and inventoried plant groups, a method that increases the speed of inventory relative to traditional techniques, while capturing a



majority of floristic pattern (Tuomisto et al. 1995, Tuomisto et al. 2003c, Higgins and Ruokolainen 2004, Ruokolainen et al. 2007). We used these data to delineate and field-test an erosion-generated floristic boundary in northwestern Amazonia between the Nauta and Pebas Formations. We then used this approach to identify a similar, erosion-generated floristic discontinuity between the Içá and Pebas Formations in western Brasil. Collectively, our findings demonstrate long-term geological control of floristic composition in Amazonia.

## **Results**

We selected a remote and undisturbed site in northern Peru that was physically accessible and contained a geological boundary between the Miocene Pebas Formation in the north, and the overlying Late Miocene Nauta Formation in the south (INGEMMET 2000, Rebata et al. 2006). We assembled Landsat and SRTM mosaics for this area, and searched for matched patterns in these two datasets. We observed a discontinuity of over 300 km in our Landsat data between the Pebas Formation, represented by light tones, and the Nauta Formation, represented by dark tones, indicating a difference in plant species composition between the two formations (Figure 7A). Coincident with this discontinuity, we observed a 20m topographic discontinuity in our SRTM data between the overlying Nauta Formation and the underlying Pebas

Formation (Figure 7B). This indicates that these floristic patterns were caused by the removal of the Nauta Formation to expose the Pebas Formation. Further analysis of SRTM data indicates that uplift in the north along the Vaupes and Iquitos arches has caused the Tigre and Pucacuro rivers to remove the more friable sediments of the Nauta Formation from their upper reaches, and expose the older Pebas Formation sediments beneath (Roddaz et al. 2005). This sediment removal is occurring along v-shaped erosion frontiers that are progressing laterally from northwest to southeast along the courses of these rivers. We manually delineated this discontinuity from imagery and sampled it for plants and soils in the field.

We inventoried plants and collected soils at 138 sites on either side of this boundary using a standard procedure (Tuomisto et al. 2003a, Tuomisto et al. 2003c). Access was provided by 450km of road and river, for a study area of approximately 50,000 km<sup>2</sup>. At each site we established a 5 m by 500 m linear transect, along which we collected presence-absence data for pteridophytes (ferns and lycophytes). At a subset of 104 sites we also collected presence-absence data for the Melastomataceae (a large tropical family of mostly shrubs and small trees). These plant taxa reveal most of the floristic pattern captured by traditional tree inventories with a much smaller time investment (Tuomisto et al. 1995, Ruokolainen et al. 1997, Ruokolainen et al. 2007). In addition these taxa are phylogenetically remote, and thus provide independent tests of biogeographic and ecological hypotheses. In total, we encountered 191 pteridophyte

species (average 31 per transect) and 210 Melastomataceae species (32 per transect). Soil samples were analyzed at a single laboratory for pH; loss on ignition (a measure of organic matter content); concentration of P, Al, Ca, K, Mg, and Na; and percentages of sand, silt, and clay.

This erosion-generated boundary corresponded to an abrupt and profound discontinuity in plant species composition. Pteridophyte and Melastomataceae data identically divided the transects into two groups, almost perfectly separated by the discontinuity and corresponding to the two geological formations (Figure 7A). Average species turnover between transects from different groups was 89% for both pteridophytes and Melastomataceae (Jaccard index), and approximately 80% of both pteridophyte and Melastomataceae species analyzed were statistically significant indicators of one of the two groups (indicator species analysis,  $P < 0.05$ , Tables 11 and 12). Neither group was internally homogeneous, however, and the average species turnover among transects from the same group was 61% and 73% for pteridophytes and Melastomataceae, respectively. This internal turnover was spatially coherent, such that the poor-soil transects in the north of the study area split into two distinct subgroups (Figure 7, inset). In addition, three transects in the west of our study area are located in a branch of the Pastaza Fan, a vast volcanoclastic Holocene aggradational plain deposited by the Rio Pastaza (Figure 7, inset) (Räsänen et al. 1990, Räsänen et al. 1992). These sites were floristically distinct from neighboring sites on the Nauta formation and classified

instead with the Pebas Formation, further emphasizing the role of geology in determining floristic composition.

The erosion-generated boundary also corresponded to an abrupt and substantial change in soil properties (Figure 7B). Sites in the Pebas Formation, north of the boundary, had on average 15 times greater soil cation concentrations (sum of Ca, Na, Mg, and K ) than sites in the Nauta Formation, south of the boundary (excluding Pastaza Fan sites; eight times greater if these were included with the Nauta sites; Kruskal-Wallis test,  $P < 0.0001$ ). Overall, cation concentrations in our study area range from 0.08 to 24.1 cmol(+)/kg, comparable to the overall range documented for Brazilian and Peruvian Amazonia (<0.1 to 39 cmol(+)/kg; (Sanchez and Buol 1974, Botschek et al. 1996, Tuomisto et al. 2003c).

Using multiple regression on distance matrices (Legendre et al. 1994, Tuomisto et al. 2003c), we found that 71% and 66% of the observed variation in compositional differences of pteridophytes and Melastomataceae, respectively, could be explained by a simple model consisting of edaphic differences and log-transformed geographical distances. The unique contribution of soil differences was 58% and 39% for pteridophytes and Melastomataceae, respectively, and that of log-transformed geographical distances was 2% and 7%, respectively. The remainder was jointly explained by edaphic and geographical distances. These results suggest that these

floristic patterns are generated primarily by edaphic variation, rather than dispersal dynamics or chance effects (Hubbell 2001).

To estimate the potential importance of the discontinuity for tree species composition, we used an adjacent network of 14 tree inventory plots. We first divided the tree plots into two groups of seven, such that the ranges of soil cation content in each group matched those on either side of the discontinuity. Of the 65 tree species analyzed, 28% were significantly associated with one of these two soil-defined groups, and of the 29 most abundant tree species, 48% were significantly associated (indicator species analysis,  $P < 0.05$ , Table 13). These findings are consistent with strong associations between tree species composition, soil variables, and geological formation observed over very short distances in southern Peru (Phillips et al. 2003a); and abrupt changes in tree species composition observed at sites close to ours (Pitman et al. 2008).

To determine whether similar erosional processes may have generated floristic discontinuities elsewhere in western Amazonia, we assembled continental-scale Landsat and SRTM mosaics, with a focus on the interface of the widespread Pebas and Içá Formations. Matching patterns in these datasets revealed a north-south discontinuity of at least 1,500 km in western Brasil (Figure 8). We manually delineated this discontinuity from our imagery, and found that it corresponds to the boundary between the Pebas Formation in the west and the Içá Formation in the east. As in our study area, the Pebas Formation is represented by light tones in Landsat imagery, and the overlying Içá

Formation by dark tones, indicating a comparable difference in floristic composition (Figure 8B). Also as in our study area, the Içá Formation is elevated approximately 21m above the underlying Pebas Formation (Figure 8C), consistent with the difference in elevation (20m) observed between the Nauta and Pebas Formations. This suggests relatively uniform depth of Late Miocene-Pleistocene sediments.

The erosional processes responsible for the removal of Late Miocene-Pleistocene sediments also appear to be similar at both sites. As in our study area (Figure 7), the Pebas-Içá discontinuity (Figure 8) consists of a series of v-shaped erosion frontiers along the Jurua, Amazon, Putumayo, and Caqueta rivers and their tributaries. These erosion frontiers are driven by uplift at the Serra do Moa, Iquitos, and Vaupes arches, and appear to be progressing eastwards along the courses of these rivers. Though the original, planar deposurface is preserved to the east of the erosional boundary, as the Içá Formation, erosion is prominent to the west of the boundary where the Pebas Formation has been exposed. The net effect along our long boundary is thus an eastwards-advancing front of erosion. This boundary is located approximately 1000km from the Andean uplift, indicating that the Andean orogeny exerts a long-distance influence upon floristic composition in lowland Amazonian forests.

## ***Discussion***

Our findings indicate that long-term sub-Andean tectonics control floristic composition in lowland Amazonian forests at distances up to 1000 kilometers from the Andean orogeny. This control is exerted through the deposition and erosion of sediments of varying fertility, which in turn generate patterns in species distributions. These patterns have been evolving since the Miocene, and are driven by the Andean uplift and ultimately the subduction of the oceanic Nazca Plate beneath the continental South American Plate. To support this hypothesis we provide two lines of evidence: the contrast in western Amazonia between Late Miocene-Pleistocene islands and the underlying Miocene Pebas Formation matrix; and the long, erosion-generated boundary in western Brasil between the Late Miocene-Pleistocene Içá Formation and the Pebas Formation.

The combination of Landsat imagery and SRTM digital elevation data proved to be a powerful tool for identifying floristic patterns of geological origin. We used matched patterns in these data to identify a 300km erosion-generated boundary in western Amazonia between the Late Miocene-Pleistocene Nauta Formation and the Miocene Pebas Formation. Field data confirmed that this boundary corresponds to a 15-fold difference in soil cation availability and an almost complete change in plant species composition. These patterns were identical for the phylogenetically-remote Pteridophytes and Melastomataceae, and consistent with nearby changes in tree species composition.

Based on the success of this approach, we assembled continental-scale Landsat and SRTM mosaics and used these to examine the interface between the Pebas and Içá Formations. Matched patterns in these data revealed an erosion-generated discontinuity of at least 1500km that is identical in tone, geomorphology, and erosion dynamics to that observed in our study area. This discontinuity explains observed large-area changes in soil properties (Sombroek 1991) and forest physiognomy (IBGE 2004), and coincides with abrupt changes in mammal genotypes (Patton et al. 1994) and fish species composition and biomass (Arbelaez et al. 2008). We argue that this discontinuity represents the chemical and ecological limit between western and central Amazonia, and recommend further geological, soils, and biological inventory along this vast boundary.

Our findings indicate that Amazonian forests do not change gradually over large distances (Condit et al. 2002, ter Steege et al. 2006), but are instead partitioned into broad-scale compositional units on the basis of geological formations and their edaphic properties. Discussion of partitions in Amazonian forests has previously focused on the role of rivers in limiting bird and primate dispersal (Ayres and Cluttonbrock 1992, Hayes and Sewlal 2004), and these are consequently used as limits in both species distribution (Schulenberg et al. 2007) and ecoregion (Dinerstein et al. 1995) maps. Our results, however, demonstrate that geological boundaries can create significant ecological discontinuities in continuous forest, perpendicular to rivers. These geological



and edaphic units, furthermore, do not reflect a simple Amazonia-wide east-west gradient in soil age and fertility. Instead, the properties of geological formations depend upon the region-specific conditions under which they were formed, and the patterns we observe reflect a complex history of deposition and erosion dating to the Miocene. As such, the present study provides a coherent geological explanation for previous reports of poor-soil tree floras in some western Amazonian localities (Pitman et al. 2008, Honorio Coronado et al. 2009). Last, consistent with previous studies, we find that soil properties are the primary determinant of species composition in our study area (Tuomisto et al. 1995, Phillips et al. 2003a, Tuomisto et al. 2003a, Tuomisto et al. 2003b, Tuomisto et al. 2003c, Salovaara et al. 2004, ter Steege et al. 2006). Continental-scale studies of the Amazonian tree flora, however, have found secondary control of composition by dry season length (ter Steege et al. 2006). We suggest that geological formations provide an edaphic framework upon which large-area variations due to climate are superimposed.

These findings may also have implications for the function and evolution of Amazonian forests. Soil properties and floristic composition are correlated with ecosystem properties such as wood density, productivity, and forest dynamics. This suggests that the geological and compositional units described here may also correspond to continent-scale functional units (Malhi et al. 2004, Phillips et al. 2004, ter Steege et al. 2006). Moreover, the geological and edaphic patterns observed today have

been evolving since at least the Miocene, and reflect the gradual transformation of western Amazonia from a landscape dominated by nutrient-poor Late Miocene-Pleistocene fluvial or deltaic deposits, to a landscape dominated by nutrient-rich Miocene Pebas Formation deposits. This provides a new mechanism for diversification in western Amazonia, and suggests that plant taxa that were adapted to the prevailing poor soils in the Late Miocene may have been triggered to radiate into more nutrient-rich soils as these became increasingly available in western Amazonia during the Pleistocene (c. 2 mya). This scenario is consistent with the rapid Pleistocene diversification of the rich-soil plant genus *Inga* (Richardson et al. 2001), and the mid Miocene-Pleistocene evolution of clay-associated Burseraceae from species associated with nutrient-poor alluvial deposits (Fine et al. 2005). This is also consistent with the recent divergence of western and eastern Amazonian avian (Bates et al. 1998, Aleixo and Rossetti 2007, Ribas et al. 2009) and primate (Silva and Oren 1996) taxa.

Our findings illustrate the challenges of mapping compositional and functional patterns in these forests. Consistent with previous studies (Phillips et al. 2003a, Tuomisto et al. 2003a, Tuomisto et al. 2003b, Tuomisto et al. 2003c, Honorio Coronado et al. 2009), we observe substantial edaphic and floristic heterogeneity in western Amazonia, suggesting that previous findings of large-scale homogeneity may be the result of undersampling (see also (Tuomisto et al. 2003c)). We also observe abrupt changes in floristic composition, in agreement with findings at nearby sites (Pitman et al.

2008), indicating that interpolation of compositional or functional patterns (Malhi et al. 2006, ter Steege et al. 2006) should be done with caution as abrupt discontinuities in forest properties render methods based on gradual change unreliable. Together, these findings suggest that attempts to map patterns in these forests would benefit greatly from a combination of image interpretation and targeted ground inventories.

Accurate maps of large-area compositional and functional patterns in Amazonia are particularly important for conservation and management efforts (Dinerstein et al. 1995, Margules and Pressey 2000). The existence of compositionally and functionally-distinct regions in Amazonian forests suggests that protected-area and carbon-sequestration strategies be developed and implemented in a region-by-region manner. Mapping of ecological regions, however, has relied primarily on surrogate variables or expert opinion rather than on-the-ground inventory and image interpretation (Dinerstein et al. 1995). The methods described here could be applied across Amazonia to rapidly identify and map floristic patterns in a three-stage approach: first, inspection of Landsat and SRTM data to identify matching geological and floristic boundaries; second, use of taxa-based plant inventory, soil sampling, and geological study to verify these boundaries; and last, image interpretation to map these boundaries. Further subsampling with additional plant or animal taxa could last be used to determine the broader utility of these divisions. The maps generated by this process would then be

used to create more effective and compelling strategies for the management and protection of the world's most extensive tropical forests.

## ***Materials and Methods***

### **Landsat image mosaics and image interpretation**

All Landsat image mosaics were constructed from orthorectified Geocover imagery (Tucker et al. 2004), downloaded from the Global Landcover Facility (GLCF, University of Maryland, USA, <http://glcf.umiacs.umd.edu>). This imagery is free to the public and of high positional accuracy. Two to three Geocover images are available for each path/row combination, and we selected the image that was either least cloudy or of the same date as neighboring images (Figures 9 and 10). The only exception was the image used for path 8, row 62 (Figure 7), for which cloud-free Geocover imagery was not available. In this case we used an unrectified but cloud-free image and orthorectified it using a Geocover image and SRTM data for that location. As recommended by Tuomisto et al. (Tuomisto et al. 2003a) we used bands four, five and seven of the original Landsat images to construct our mosaics. All images were first subset to the extent of the final mosaic area and then assembled sequentially to produce the final mosaic. Dense clouds in image overlap areas were excluded from image matching when doing so

improved the matching product (three cases: paths, rows 4,63; 4,64; 5,61), or were removed from images prior to mosaicking (one case: path 3, row 63). Once assembled, our final mosaics were processed uniformly to improve interpretability by contrast stretching and low-pass spatial convolution, as recommended by Hill and Foody (Hill and Foody 1994) and Tuomisto et al. (Tuomisto et al. 1994). All of the preceding operations were conducted in Erdas Imagine v. 8.7 (Leica Geosystems GIS & Mapping LLC.). We subsequently used ArcGIS v. 9.1 (ESRI Inc.) to remove linear brightness trends from each of the final mosaic bands in order to remove the brightness trend artifact noted by Toivonen et al. (Toivonen et al. 2006). For display and interpretation, bands four, five, and seven were assigned to red, green, and blue, respectively. Image interpretation was performed manually by MH, but simple automated classification techniques (principal components analysis and image thresholding) yield similar results. Interpretations are conservative and the actual extent of the boundaries is likely longer than indicated.

## **SRTM mosaics and elevation calculations**

Shuttle radar topography mission (SRTM) digital elevation data (Rodriguez et al. 2006) was downloaded from the USGS National Map Seamless Server (<http://seamless.usgs.gov>) in 83 non-overlapping tiles. This data is free to the public and

of high positional and heighting accuracy. These were then mosaicked into a single image in ArcGIS v.9.1 that encompasses all of South America, north of Chile (approximately 20° south). This dataset was used in figures 7 and 8, and contrast stretches were applied uniformly to maps and insets to improve interpretability. To quantify changes in elevation across the boundaries identified in our Landsat and SRTM data, we used ArcGIS v. 9.1 to construct 10km buffers on either side of these boundaries and calculate mean elevation within these buffers. These values were then used to compute the mean differences in elevation across the boundaries.

## **Pteridophyte and Melastomataceae transect analyses**

Pteridophyte and Melastomataceae inventory was limited to non-inundated forests on non-white sand soils in order to focus on the clay terra-firme soils that comprise the majority of the Amazonian lowlands. For clustering analysis, distance matrices were calculated using the Jaccard index, and clustering groups were generated using the group-averaging method (UPGMA; PC-ORD v 4.41; MjM Software). Indicator species analysis (Dufrene and Legendre 1997) was conducted using the two-group clustering result and species present in seven or more transects (Tables 11 and 12).

For multiple regression analyses, distance matrices for environmental variables (pH; loss on ignition; log-transformed concentrations of P, Al, Ca, K, Mg, and Na;

percentages of sand, silt, and clay; and log-transformed geographic distance) were calculated using Euclidean distance, and matrices for floristic variables (Pteridophyte and Melastomataceae presence-absence data) were calculated using the one-complement of the Jaccard index. We used backwards elimination to exclude, from the final regression model, environmental distance matrices without a significant contribution to floristic distance ( $P < 0.1$  after Bonferroni correction). For Pteridophytes, the final models included pH; log-transformed concentrations of Al, Ca, K, and Mg; percentage of clay or silt; and log-transformed geographic distance. For Melastomataceae, the same variables were retained with the exception of pH and percent clay. In both cases, Ca and Mg distances made the greatest contribution to floristic dissimilarity, with a combined unique contribution of 37% and 23% to variation in Pteridophyte and Melastomataceae dissimilarities, respectively.

## **Tree plot analyses**

We used 0.1ha,  $\geq 2.5$ cm diameter tree plots from Loreto, Peru, that were not located in inundated or white-sand sites and for which standardized abundance data and soil data were available (Allpgen1, Allpihan, Allpisac, Allp4, CN-01, CN-02, CN-03, CS-01, CS-02, CS-03, IN-01, SU-01, Yanamono 1 and Yanamono 2) (Phillips and Miller 2002, Phillips et al. 2003b). We divided these plots into two groups using a cation

concentration of 2.09 cmol(+)/kg (sum of the concentrations of Ca, Mg, Na, and K), the value that divided the pteridophyte transects into two groups with the smallest number of misclassifications relative to the primary clustering groups.

Indicator species values and significances were calculated for all tree species present in five or more plots, and lianas and stranglers were excluded from analyses (Table 13). Abundance data were used for analyses, and we defined the most abundant tree species as those with on average at least one individual per plot. Because we lacked tree plot data for the richest quarter of the fertility gradient in our study area, our results provide conservative estimates of the actual tree species turnover along our edaphic gradient. To estimate the degree to which we may have underestimated tree turnover, we divided our pteridophyte and Melastomataceae transects into two groups on the basis of the above cation concentration, and found that 87% and 76% of pteridophyte and Melastomataceae species, respectively, are significantly associated with the cation-defined groups when all transects are used; versus 71% and 61%, respectively, when the richest quarter of transects are excluded (indicator species analysis (Dufrene and Legendre 1997), for species present in eight or more transects,  $P < 0.05$ ; Tables 11 and 12).

Our analyses also underestimate the associations between tree distributions and the edaphic gradient, because the small number of tree plots available for our analyses and the relatively low individuals/species ratio for Neotropical trees make obtaining significant results difficult (Jones et al. 2008). These reasons also explain why analyses



with presence-absence tree data yielded lower proportions of significant associations (15% of all species analyzed, and 28% of most abundant species, were significantly associated with the gradient) than analyses with abundance data.

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Table 11: Indicator species analysis results for pteridophyte species.

Species	Clustering-defined groups			Cation-defined groups, all transects			Cation-defined groups, excluding richest quarter of transects		
	Geological group <sup>1</sup>	IV <sup>2</sup>	P <sup>3</sup>	Cation group <sup>4</sup>	IV <sup>2</sup>	P <sup>3</sup>	Cation group <sup>4</sup>	IV <sup>2</sup>	P <sup>3</sup>
Adiantum amazonicum A.R. Smith	Nauta	18.82	***	Poor	16.35	**	Poor	14.08	NS
Adiantum cayennense Willd. ex Klotzsch or tuomistoanum J. Prado	Nauta	65.96	***	Poor	60.78	***	Poor	63.02	***
Adiantum sp. 12	Nauta	12.94	**	Poor	12.79	**	Poor	11.36	NS
Adiantum terminatum Kunze ex Miq.	Nauta	70.66	***	Poor	67.61	***	Poor	69.07	***
Adiantum tomentosum Kl.	Nauta	72.96	***	Poor	74.42	***	Poor	76.25	***
Asplenium cuneatum Lam.	Nauta	5.76	NS	Poor	4.19	NS	-	-	-
Asplenium hallii Hook.	Nauta	37.65	***	Poor	37.21	***	Poor	35	***
Cnemidaria ewanii (Alston) Tryon	Nauta	33.46	***	Poor	29.07	**	Poor	29.2	NS
Cyathea lasiosora (Mett. ex Kuhn) Domin	Nauta	83.85	***	Poor	82.88	***	Poor	82.99	***
Cyathea macrosora (Baker) Domin	Nauta	44.71	***	Poor	44.19	***	Poor	38.79	***
Cyathea sp. 5	Nauta	13.93	NS	Poor	8.81	NS	Rich	12.48	NS
Cyclodium meniscioides (Willd.) Presl	Nauta	86.73	***	Poor	85.72	***	Poor	85.95	***
Cyclodium trianae (Mett.) A.R. Smith	Nauta	13.03	*	Poor	7.25	NS	Rich	7.12	NS
Danaea cartilaginea Christenhusz & Tuomisto	Nauta	52.97	***	Poor	47.9	***	Poor	49.18	***
Danaea leprieurii Kunze, bipinnata Tuomisto or sp.4	Nauta	55.39	***	Poor	52.53	***	Poor	54.14	***
Danaea sp. 24	Nauta	17.89	**	Poor	19.83	***	Poor	21.32	*
Elaphoglossum flaccidum (Fée) Moore	Nauta	24.27	NS	Poor	25.73	*	Poor	28	NS

Elaphoglossum luridum (Fée) Christ	Nauta	24.2	**	Poor	23.92	**	Poor	23.27	NS
Lindsaea bolivarensis V. Marcano	Nauta	14.12	**	Poor	13.95	**	Poor	13.75	*
Lindsaea divaricata Kl. var. 1	Nauta	12.94	**	Poor	12.79	**	-	-	-
Lindsaea divaricata Kl. var. 2	Nauta	39.28	***	Poor	40.95	***	Poor	44.02	**
Lindsaea falcata Dryand.	Nauta	34.12	***	Poor	33.72	***	Poor	30	***
Lindsaea guianensis (Aubl.) Dryand.	Nauta	43.53	***	Poor	43.02	***	Poor	42.5	***
Lindsaea lancea (L.) Bedd. var. lancea	Nauta	55.29	***	Poor	54.65	***	Poor	51.28	***
Lindsaea sp. 18	Nauta	17.72	**	Poor	11.56	NS	Poor	10.59	NS
Lindsaea sp. 8	Nauta	55.32	***	Poor	52.42	***	Poor	53.98	***
Lindsaea sp. 9	Nauta	7.84	NS	Poor	9.38	NS	Poor	8.93	NS
Lindsaea taeniata K.U. Kramer	Nauta	47.17	***	Poor	46.62	***	Poor	47.76	***
Lomariopsis nigropaleata Holttum	Nauta	63.79	***	Poor	66.5	***	Poor	73.6	**
Lomariopsis prieuriana Fée	Nauta	23.58	***	Poor	17.12	*	Poor	16.42	NS
Metaxya rostrata (HBK.) Presl	Nauta	56.67	***	Poor	53.83	***	Poor	55.38	***
Microgramma megalophylla (Desv.) Sota	Nauta	16.47	**	Poor	16.28	**	Poor	15	*
Nephrolepis rivularis (Vahl.) Mett. ex Krug	Nauta	52.95	**	Poor	53.99	**	Poor	57.25	NS
Polybotrya pubens Mart.	Nauta	75.45	***	Poor	70.18	***	Poor	70.66	***
Polybotrya sessilisora R.C.Moran	Nauta	69.41	***	Poor	68.6	***	Poor	67.5	***
Polypodium adnatum Klotzsch or dasypleuron Kze.	Nauta	16.33	NS	Poor	17.89	NS	Poor	20.83	NS
Polytaenium guayanense (Hieron.) Alston	Nauta	11.29	NS	Poor	11.16	NS	-	-	-
Saccoloma elegans Kaulfuss	Nauta	8.24	**	-	-	-	-	-	-
Saccoloma inaequale (Kunze) Mettenius	Nauta	74.36	***	Poor	77.07	***	Poor	81.63	***
Salpichlaena hookeriana (O. Kuntze) Alston	Nauta	15.37	**	Poor	15.19	*	Poor	16.33	NS
Salpichlaena volubilis (Kaulf.) J. Smith	Nauta	52.71	***	Poor	59.8	***	Poor	65.93	***
Schizaea elegans	Nauta	16.47	***	Poor	16.28	**	Poor	15	*

(Vahl.) Sw. Selaginella lechleri Hieron.	Nauta	39.1	***	Poor	40.82	***	Poor	42.63	***
Selaginella palmiformis Alston ex Crabbe & Jermy	Nauta	8.24	*	-	-	-	-	-	-
Selaginella parkeri (Hook. & Grev.) Spring or sp. 8	Nauta	55.39	***	Poor	52.53	***	Poor	52.73	***
Tectaria brauniana (Karst.) C. Chr.	Nauta	11.76	**	Poor	11.63	**	-	-	-
Trichomanes accedens Presl	Nauta	13.03	*	Poor	12.88	*	Poor	11.36	NS
Trichomanes cellulosum Kl.	Nauta	9.41	*	Poor	9.3	*	-	-	-
Trichomanes elegans Rich.	Nauta	80.07	***	Poor	79.13	***	Poor	78.82	***
Trichomanes hostmannianum (Kl.) Kunze	Nauta	8.24	*	-	-	-	-	-	-
Trichomanes martiusii Presl	Nauta	9.41	*	Poor	9.3	*	-	-	-
Trichomanes pinnatum Hedwig or sp. 1 or sp. 4	Nauta	81.73	***	Poor	82.69	***	Poor	82.47	***
Trichomanes sp. 6 (aff. elegans)	Nauta	15.37	**	Poor	17.44	***	Poor	18.75	*
Trichomanes trollii Bergdolt	Nauta	47.09	***	Poor	48.84	***	Poor	48.78	***
Triplophyllum dicksonioides (Fée) Holtum or funestum (Kze.) Holtum or sp. 1 or sp. 2	Nauta	71.01	***	Poor	70.18	***	Poor	72.96	***
Adiantum humile Kunze or obliquum Willd.	Pebas	51.48	***	Rich	50.35	**	Rich	38.52	NS
Adiantum pulverulentum L.	Pebas	86.83	***	Rich	88.5	***	Rich	74.24	***
Anetium citrifolium (L.) Splitgb.	Pebas	60.99	***	Rich	50.63	***	Rich	27.78	*
Asplenium auritum Sw.	Pebas	33.96	***	Rich	30.88	***	-	-	-
Asplenium cirrhatum Willd.	Pebas	36.85	***	Rich	29.09	***	Rich	24.24	*
Asplenium delitescens (Max.) A.R. Smith	Pebas	15.09	***	Rich	15.38	***	-	-	-
Asplenium pearcei Baker	Pebas	79.6	***	Rich	67.35	***	Rich	41.22	***
Asplenium serratum L. or stuebelianum	Pebas	34.85	NS	Poor	34.55	NS	Poor	44.14	NS

Hieron.

Bolbitis lindigii (Mett.) C.Chr.	Pebas	83.36	***	Rich	88.62	***	Rich	74.69	***
Bolbitis nicotianifolia (Sw.) Alston	Pebas	45.36	***	Rich	46.23	***	Rich	37.35	***
Campyloneurum aphanophlebium (Kunze) Moore	Pebas	18.87	***	Rich	15.58	***	-	-	-
Campyloneurum fuscusquamatum Lellinger	Pebas	60.55	***	Rich	55.38	***	Rich	31.56	***
Campyloneurum phyllitidis (L.) Presl	Pebas	12.94	NS	Rich	11.08	NS	Rich	8.89	NS
Campyloneurum sp. 4	Pebas	21.75	***	Rich	28.96	***	-	-	-
Cyathea amazonica R.C. Moran	Pebas	13.21	**	-	-	-	-	-	-
Cyathea bradei (Windish) Lellinger or pungens (Willd.) Domin	Pebas	48.45	***	Rich	44.9	**	Rich	33.82	NS
Cyathea cuspidata Kunze	Pebas	87.96	***	Rich	82.89	***	Rich	66.67	***
Danaea acuminata Tuomisto & R.C.Moran or oblanceolata Stolze	Pebas	8.63	NS	Rich	6.73	NS	Rich	10.26	NS
Danaea nodosa (L.) J. E. Smith	Pebas	85.03	***	Rich	83.37	***	Rich	68.08	***
Didymochlaena truncatula (Sw.) J. Smith	Pebas	87.63	***	Rich	79.12	***	Rich	65.31	***
Diplazium grandifolium (Sw.) Sw. var. andicola Stolze	Pebas	56.6	***	Rich	43.33	***	Rich	36.82	***
Diplazium pinnatifidum Kunze	Pebas	5.9	NS	Rich	8.65	*	-	-	-
Diplazium striatum (L.) Presl	Pebas	26.42	**	Rich	23.21	***	-	-	-
Elaphoglossum nigrescens or sp. 11	Pebas	10.98	*	Rich	8.57	NS	-	-	-
Elaphoglossum raywaense (Jenm.) Alston	Pebas	19.85	NS	Rich	22.12	NS	Rich	24.95	NS
Lindsaea phassa K.U. Kramer	Pebas	23.58	***	Rich	20.94	***	-	-	-
Lomagramma guianensis (Aubl.) Ching	Pebas	26.03	NS	Rich	22.61	NS	Rich	26.11	NS

Lomariopsis fendleri D.C.Eaton	Pebas	62.47	***	Rich	67.36	***	Rich	48.4	***
Lomariopsis japurensis (Martius) J. Smith	Pebas	87.96	***	Rich	86.24	***	Rich	72.34	***
Lomariopsis latipinna Stolze	Pebas	39.66	***	Rich	42.83	***	Rich	40.83	***
Microgramma fuscopunctata (Hooker) Vareschi or persicariifolia (Schrader) Presl or thurnii (Baker) Tryon & Stolze	Pebas	59.13	***	Rich	53.38	***	Rich	39.23	NS
Microgramma percuta (Cav.) Sota	Pebas	12.08	**	Rich	15.58	**	-	-	-
Pecluma hygrometrica (Splitg.) Price or pilodon (Kunze) Price	Pebas	39.7	***	Rich	40.47	***	-	-	-
Polybotrya caudata Kze.	Pebas	47.42	***	Rich	45.53	***	Rich	32.69	**
Polybotrya crassirhizoma Lellinger	Pebas	79.72	***	Rich	81.25	***	Rich	71.05	***
Polybotrya fractiserialis (Baker) J.Sm.	Pebas	13.42	**	Rich	13.68	**	-	-	-
Polybotrya osmundacea Willd.	Pebas	56.41	***	Rich	55.26	***	Rich	42.86	NS
Polypodium caceresii Sodiro	Pebas	18.76	***	Rich	19.12	***	Rich	16.5	**
Polytaenium cajenense (Desv.) Benedict	Pebas	56.66	***	Rich	43.81	***	Rich	31.37	***
Pteris altissima Poir.	Pebas	15.09	***	Rich	15.38	***	-	-	-
Pteris pungens Willd.	Pebas	15.28	***	Rich	19.23	***	-	-	-
Selaginella exaltata (Kunze) Spring	Pebas	16.66	NS	Rich	21.49	**	Rich	27.21	**
Selaginella haematodes (Kunze) Spring	Pebas	26.53	***	Rich	23.56	***	-	-	-
Selaginella speciosa A. Br. or sp.11	Pebas	8.04	NS	Rich	8.2	NS	Rich	11.34	NS
Stigmatopteris heterophlebia (Baker) R.C. Moran or opaca (Baker) C.Chr.	Pebas	26.53	***	Rich	20.31	***	-	-	-

Tectaria antioquoiana (Baker) C.Chr. or draconoptera (D.C.Eaton) Copel. or incisa Cav. f. vivipara (Jenm.) Morton or sp. 2	Pebas	81.79	***	Rich	86.67	***	Rich	73.64	***
Tectaria pilosa (Fée) R.C.Moran or sp. 4	Pebas	66.04	**	Rich	67.31	***	Rich	44.44	***
Thelypteris abrupta (Desv.) Proctor	Pebas	34.31	***	Rich	34.97	***	Rich	27.27	***
Thelypteris ancyriothrix (Rosenst.) A.R.Sm.	Pebas	18.87	***	Rich	19.23	***	-	-	-
Thelypteris arcanum (Maxon & Morton) Morton or chrysodioides (Fée) Morton	Pebas	16.31	**	Rich	13.74	*	-	-	-
Thelypteris biformata (Rosenst.) Tryon	Pebas	62.47	***	Rich	67.36	***	Rich	48.4	***
Thelypteris glandulosa (Desv.) Proctor var. brachyodus (Kunze) A.R.Sm. or pennellii A.R.Sm.	Pebas	19.93	**	Rich	30.77	***	-	-	-
Thelypteris lugubriformis (Rosenst.) R.Tryon	Pebas	39.62	***	Rich	40.38	***	-	-	-
Thelypteris macrophylla (Kunze) Morton	Pebas	28.69	***	Rich	23.94	**	Rich	37.93	***
Thelypteris opulenta (Kaulf.) Fosberg	Pebas	35.65	***	Rich	33.24	***	Rich	20	***
Thelypteris pennata (Poiret) Morton	Pebas	49.06	***	Rich	50	***	Rich	40.74	***
Thelypteris sp. 1	Pebas	15.09	***	Rich	15.38	***	-	-	-
Trichomanes collariatum Bosch	Pebas	37.74	***	Rich	38.46	***	-	-	-
Trichomanes diversifrons (Bory) Mett. ex Sadeb.	Pebas	36.9	***	Rich	37.61	***	Rich	35.68	***

Table sorted by geological group and then by species

A value of "-" indicates that the corresponding species was not sufficiently frequent for the specified analysis

<sup>1</sup> Group of plots for which the highest IV (indicator value) was obtained: "Nauta" indicates Nauta Formation group; "Pebas" indicates Pebas Formation group

<sup>2</sup> Indicator value

<sup>3</sup> Statistical significance of indicator value (IV): NS = p>0.05; \* = p<0.05; \*\* = p<0.01; \*\*\* = p<0.001

<sup>4</sup>Group of plots for which the highest IV (indicator value) was obtained: "Rich" indicates group with  $> 2.09$  cmol(+)/kg sum of cations; "Poor" indicates group with  $< 2.09$  cmol(+)/kg sum of cations



**Table 12: Indicator species analysis results for Melastomatacae species.**

Species	Clustering-defined groups			Cation-defined groups, all transects			Cation-defined groups, excluding richest quarter of transects		
	Geological group <sup>1</sup>	IV <sup>2</sup>	P <sup>3</sup>	Cation group <sup>4</sup>	IV <sup>2</sup>	P <sup>3</sup>	Cation group <sup>4</sup>	IV <sup>2</sup>	P <sup>3</sup>
Adelobotrys adscendens (Sw.) Tr.	Nauta	29.48	***	Poor	29.48	***	Poor	30.72	*
Adelobotrys marginata Brade	Nauta	44.16	***	Poor	44.16	***	Poor	50	***
Adelobotrys praetexta Pilg.	Nauta	17.65	*	Poor	17.65	**	Poor	16.13	NS
Adelobotrys rotundifolia Triana	Nauta	13.81	NS	Poor	13.81	NS	Poor	18.6	NS
Adelobotrys sp. 7	Nauta	16.18	*	Poor	16.18	**	Poor	17.74	*
Bellucia pentamera Naud.	Nauta	19.85	NS	Poor	19.85	NS	Poor	18.15	NS
Bellucia sp. 2	Nauta	7.56	NS	-	-	-	-	-	-
Bellucia sp. 5	Nauta	30.88	***	Poor	30.88	***	Poor	29.03	**
Blakea sp. 6	Nauta	11.76	*	Poor	11.76	*	-	-	-
Clidemia allardii Wurdack	Nauta	29.66	**	Poor	29.66	**	Poor	24.26	NS
Clidemia epibaterium DC.	Nauta	19.12	**	Poor	19.12	**	-	-	-
Clidemia longifolia Gleason	Nauta	69.63	***	Poor	69.63	***	Poor	78.47	**
Clidemia piperifolia Gleason	Nauta	41.18	***	Poor	41.18	***	Poor	43.55	***
Clidemia sp. 10	Nauta	16.18	*	Poor	16.18	**	-	-	-
Clidemia sp. 2	Nauta	46.19	***	Poor	46.19	***	Poor	48.79	**
Graffenrieda sp. 2	Nauta	42.83	***	Poor	42.83	***	Poor	48.39	***
Henriettella sp. 3	Nauta	9.93	NS	Poor	9.93	NS	Rich	8	NS
Leandra aristigera (Naud.) Cogn.	Nauta	30.95	***	Poor	30.95	***	Poor	33.94	**
Leandra candelabrum (Macbr.) Wurdack	Nauta	75.03	***	Poor	75.03	***	Poor	66.66	***
Leandra glandulifera (Tr.) Cogn.	Nauta	38.24	***	Poor	38.24	***	Poor	35.48	**
Leandra macdanielii Wurdack	Nauta	18.96	NS	Poor	18.96	NS	Poor	21.57	NS
Leandra secunda (Don) Cogn.	Nauta	16.37	NS	Poor	16.37	NS	Poor	20.65	NS
Leandra sp. 4	Nauta	10.29	NS	-	-	-	-	-	-
Loreya sp. 2	Nauta	22.06	**	Poor	22.06	**	Poor	24.19	**

Maieta guianensis Aubl.	Nauta	77.07	***	Poor	77.07	***	Poor	77.44	***
Maieta poeppigii Mart. ex Cogn.	Nauta	17	NS	Poor	17	NS	Poor	18.77	NS
Miconia abbreviata Markgraf	Nauta	11.76	NS	Poor	11.76	NS	-	-	-
Miconia ampla Tr.	Nauta	19.22	*	Poor	19.22	**	Poor	21.08	NS
Miconia barbinervis (Benth.) Tr.	Nauta	25.08	**	Poor	25.08	**	Poor	27.5	*
Miconia carassana Cogn.	Nauta	77.94	***	Poor	77.94	***	Poor	77.45	***
Miconia centrodesma Naud.	Nauta	52.29	***	Poor	52.29	***	Poor	55.76	**
Miconia crassinervia Cogn.	Nauta	48.57	***	Poor	48.57	***	Poor	53.23	***
Miconia dolichorrhyncha Naud.	Nauta	41.18	***	Poor	41.18	***	Poor	37.16	**
Miconia egensis Cogn.	Nauta	11.76	*	Poor	11.76	*	-	-	-
Miconia elata (Sw.) DC.	Nauta	43.06	NS	Poor	43.06	NS	Poor	48.89	NS
Miconia fosteri Wurdack	Nauta	20.68	**	Poor	20.68	**	Poor	24.19	*
Miconia lourteigiana Wurdack	Nauta	12.25	NS	Poor	12.25	NS	Poor	16.26	NS
Miconia minutiflora (Bonpl.) DC.	Nauta	36.82	**	Poor	36.82	***	Poor	35.73	*
Miconia multispicata Naud.	Nauta	50	***	Poor	50	***	Poor	48.39	***
Miconia nervosa (Smith) Tr.	Nauta	30.8	NS	Poor	30.8	NS	Poor	35.23	NS
Miconia paleacea Cogn.	Nauta	30.12	NS	Poor	30.12	*	Poor	33.18	NS
Miconia phanerostila Pilger	Nauta	32.35	***	Poor	32.35	***	Poor	24.29	*
Miconia pilgeriana Ule	Nauta	29.48	**	Poor	29.48	***	Poor	29.11	*
Miconia poeppigii Triana	Nauta	15.13	NS	Poor	15.13	NS	Poor	13.44	NS
Miconia prasina (Sw.) DC.	Nauta	44.32	***	Poor	44.32	**	Poor	45.04	NS
Miconia pterocaulon Tr.	Nauta	36.76	***	Poor	36.76	***	Poor	37.1	***
Miconia pujana Markgr. in Diels	Nauta	32.35	***	Poor	32.35	***	Poor	27.42	**
Miconia punctata (Desr.) D. Don	Nauta	33.36	NS	Poor	33.36	NS	Poor	35.41	NS
Miconia rimachii Wurdack	Nauta	25	***	Poor	25	**	Poor	24.19	**
Miconia schunkei Wurdack	Nauta	48.53	***	Poor	48.53	***	Poor	46.97	**
Miconia sp. 105	Nauta	14.83	*	Poor	14.83	*	Poor	17.74	*

Miconia sp. 11	Nauta	55.88	***	Poor	55.88	***	Poor	50.05	***
Miconia sp. 16	Nauta	20.72	NS	Poor	20.72	NS	Poor	23.31	NS
Miconia sp. 18	Nauta	42.35	**	Poor	42.35	**	Poor	40.28	NS
Miconia sp. 24	Nauta	8.56	NS	Poor	8.56	NS	Poor	10.32	NS
Miconia sp. 35	Nauta	31.71	NS	Poor	31.71	NS	Poor	44.29	*
Miconia sp. 46	Nauta	13.37	NS	Poor	13.37	NS	Poor	11.88	NS
Miconia sp. 48	Nauta	14.71	*	Poor	14.71	*	Poor	16.13	NS
Miconia sp. 49	Nauta	13.24	*	Poor	13.24	*	-	-	-
Miconia sp. 50	Nauta	19.46	*	Poor	19.46	*	Poor	21.35	NS
Miconia sp. 56	Nauta	13.24	*	Poor	13.24	*	-	-	-
Miconia sp. 6	Nauta	25	***	Poor	25	**	Poor	19.35	*
Miconia sp. 82	Nauta	13.24	*	Poor	13.24	*	-	-	-
Miconia sp. 83	Nauta	16.18	*	Poor	16.18	*	Poor	17.74	*
Miconia sp. 86	Nauta	19.12	**	Poor	19.12	**	Poor	15.01	NS
Miconia sp. 87	Nauta	11.76	*	Poor	11.76	*	-	-	-
Miconia sp. 89	Nauta	30.88	***	Poor	30.88	***	Poor	32.26	**
Miconia sp. 98	Nauta	19.12	**	Poor	19.12	**	-	-	-
Miconia sp. 99	Nauta	13.69	NS	Poor	13.69	NS	Poor	16.26	NS
Miconia spichigeri Wurdack	Nauta	17.65	**	Poor	17.65	**	-	-	-
Miconia splendens (Sw.) Grieseb.	Nauta	11.76	*	Poor	11.76	NS	-	-	-
Miconia subspicata Wurdack	Nauta	33	NS	Poor	33	NS	Poor	38.71	NS
Miconia tetragona Cogn.	Nauta	22.15	**	Poor	22.15	**	Poor	21.35	NS
Miconia tetrasperma Gleason	Nauta	44.16	***	Poor	44.16	***	Poor	43.76	**
Miconia tomentosa (L. C. Rich.) D. Don	Nauta	69.18	***	Poor	69.18	***	Poor	76.64	***
Miconia traillii Cogn.	Nauta	52.98	***	Poor	52.98	***	Poor	51.66	***
Miconia umbriensis Wurdack	Nauta	39.71	***	Poor	39.71	***	Poor	32.82	*
Miconia zubenatana Macbr.	Nauta	8.01	NS	Poor	8.01	NS	-	-	-
Monolena primulaeflora Hook.	Nauta	7.56	NS	-	-	-	-	-	-
Ossaea araneifera Mkgf.	Nauta	75	***	Poor	75	***	Poor	71	***
Ossaea boliviensis (Cogn.) Gleason	Nauta	34.81	NS	Poor	34.81	NS	Poor	42.38	NS
Ossaea bullifera (Pilger) Gleason	Nauta	19.12	**	Poor	19.12	**	Poor	15.01	NS
Ossaea cucullata Gleason	Nauta	54.72	***	Poor	54.72	***	Poor	64.55	***
Tococa caryophyllea (DC.) Renner	Nauta	22.06	**	Poor	22.06	**	Poor	19.35	*
Tococa sp. 2	Nauta	63.27	***	Poor	63.27	***	Poor	61.33	***
Tococa ulei Pilger	Nauta	63.39	***	Poor	63.39	***	Poor	63.2	**

Adelobotrys klugii Wurdack	Pebas	27.61	***	Rich	27.61	***	Rich	24.62	**
Adelobotrys scandens (Aubl.) DC. subsp. elongata Schulman	Pebas	19.44	**	-	-	-	-	-	-
Adelobotrys tessmannii Markgr. subsp. latifolia Schulman	Pebas	36.76	***	Rich	36.76	***	-	-	-
Blakea rosea (R. & P.) D. Don	Pebas	40.5	*	Rich	40.5	*	Rich	28.85	NS
Clidemia dimorphica Macbr.	Pebas	31.41	NS	Rich	31.41	NS	Rich	33.79	NS
Clidemia epiphytica (Tr.) Cogn.	Pebas	16.67	NS	Rich	16.67	NS	Rich	16	NS
Clidemia heterophylla (Desr.) Gleason	Pebas	32.11	**	Rich	32.11	***	Rich	37.89	**
Clidemia septuplinervia Cogn.	Pebas	67.06	***	Rich	67.06	***	Rich	66.18	***
Clidemia serpens (Tr.) Cogn.	Pebas	11.34	NS	Rich	11.34	NS	-	-	-
Clidemia sp. 3	Pebas	25	***	Rich	25	***	-	-	-
Clidemia sprucei Gleason	Pebas	21.37	**	Rich	21.37	***	-	-	-
Henriettea sp. 1	Pebas	8.68	NS	Rich	8.68	NS	-	-	-
Leandra caquetana Sprague	Pebas	30.77	***	Rich	30.77	***	-	-	-
Leandra longicoma Cogn.	Pebas	61.75	***	Rich	61.75	***	Rich	50.14	***
Miconia acutipetala Sprague	Pebas	36.76	***	Rich	36.76	***	Rich	38.46	***
Miconia aureoides Cogn.	Pebas	22.22	***	Rich	22.22	***	-	-	-
Miconia decurrens Cogn.	Pebas	18.15	NS	Rich	18.15	NS	Rich	16.88	NS
Miconia grandifolia Ule	Pebas	53.78	***	Rich	53.78	***	Rich	38.46	***
Miconia lamprophylla Tr.	Pebas	36.3	***	Rich	36.3	***	Rich	41.67	***
Miconia lugonis Wurdack	Pebas	24.01	***	Rich	24.01	***	Rich	38.46	***
Miconia napoana Wurdack	Pebas	9.88	NS	Rich	9.88	NS	Rich	9.62	NS
Miconia procumbens (Gleason) Wurdack	Pebas	38.89	***	Rich	38.89	***	-	-	-
Miconia serrulata (DC.) Naud.	Pebas	48.31	***	Rich	48.31	***	Rich	51.43	***
Miconia sp. 108	Pebas	25	***	Rich	25	***	-	-	-
Miconia sp. 15	Pebas	49	***	Rich	49	***	Rich	41.67	***
Miconia sp. 19	Pebas	26.08	**	Rich	26.08	**	Rich	22.86	**

Miconia sp. 27	Pebas	35.56	***	Rich	35.56	***	Rich	38.46	***
Miconia sp. 3	Pebas	40.37	**	Rich	40.37	**	Rich	35.16	NS
Miconia sp. 33	Pebas	10	NS	Rich	10	NS	-	-	-
Miconia sp. 37	Pebas	19.44	**	-	-	-	-	-	-
Miconia sp. 40	Pebas	28.41	***	Rich	28.41	***	Rich	16.33	NS
Miconia sp. 43	Pebas	17.01	**	Rich	17.01	**	-	-	-
Miconia sp. 44	Pebas	36.76	***	Rich	36.76	***	Rich	40.5	***
Miconia sp. 5	Pebas	9.92	NS	-	-	-	-	-	-
Miconia sp. 60	Pebas	33.33	***	Rich	33.33	***	-	-	-
Miconia sp. 73	Pebas	44.6	***	Rich	44.6	***	Rich	40.5	***
Miconia spennerostachya Naud.	Pebas	25	***	Rich	25	***	-	-	-
Miconia trinervia (Sw.) D. Don ex Loud.	Pebas	11.11	NS	Rich	11.11	NS	-	-	-
Miconia triplinervis R. & P.	Pebas	33.33	***	Rich	33.33	***	-	-	-
Tococa caquetana Sprague	Pebas	57.67	***	Rich	57.67	***	Rich	46.51	NS
Triolena amazonica (Pilger) Wurdack	Pebas	80.65	***	Rich	80.65	***	Rich	48	***

Table sorted by geological group and then by species

A value of "-" indicates that the corresponding species was not sufficiently frequent for the specified analysis

<sup>1</sup> Group of plots for which the highest IV (indicator value) was obtained: "Nauta" indicates Nauta Formation group; "Pebas" indicates Pebas Formation group

<sup>2</sup> Indicator value

<sup>3</sup> Statistical significance of indicator value (IV): NS =  $p > 0.05$ ; \* =  $p < 0.05$ ; \*\* =  $p < 0.01$ ; \*\*\* =  $p < 0.001$

<sup>4</sup> Group of plots for which the highest IV (indicator value) was obtained: "Rich" indicates group with  $> 2.09$  cmol(+)/kg sum of cations; "Poor" indicates group with  $< 2.09$  cmol(+)/kg sum of cations

**Table 13: Indicator species analysis results for tree species.**

Species	Abundance <sup>1</sup>	Cation group <sup>2</sup>	Abundance data		Presence-absence data	
			IV <sup>3</sup>	P <sup>4</sup>	IV <sup>3</sup>	P <sup>4</sup>
<i>Astrocaryum chambira</i> Burret	High	Poor	75.63	*	64.29	NS
<i>Astrocaryum murumuru</i> Mart.	High	Rich	64.39	NS	44.64	NS
<i>Attalea racemosa</i> Spruce	High	Rich	53.33	NS	32.65	NS
<i>Cordia nodosa</i> Lam.	High	Poor	40.6	NS	51.43	NS
<i>Eschweilera coriacea</i> (DC.) S.A. Mori	High	Poor	79.07	**	63.64	NS
<i>Eschweilera tessmannii</i> R. Knuth	High	Poor	28.57	NS	38.1	NS
<i>Guarea grandifolia</i> DC.	High	Rich	67.67	*	57.14	NS
<i>Guarea kunthiana</i> A. Juss.	High	Rich	69.39	NS	64.29	NS
<i>Iriartea deltoidea</i> Ruiz & Pav.	High	Rich	85	**	77.78	*
<i>Iryanthera juruensis</i> Warb.	High	Poor	36.57	NS	51.43	NS
<i>Iryanthera laevis</i> Markgr.	High	Poor	36.73	NS	32.65	NS
<i>Iryanthera paraensis</i> Huber	High	Rich	49.62	NS	46.75	NS
<i>Iryanthera ulei</i> Warb.	High	Poor	40.82	NS	32.65	NS
<i>Leonia glycyarpa</i> Ruiz & Pav.	High	Poor	33.77	NS	39.68	NS
<i>Lepidocaryum tenue</i> Mart.	High	Poor	99.29	***	87.5	**
<i>Nealchornea yapurensis</i> Huber	High	Rich	32.65	NS	28.57	NS
<i>Oenocarpus bataua</i> Mart.	High	Poor	66.59	*	51.02	NS
<i>Otoba glycyarpa</i> (Ducke) W.A. Rodrigues & T.S. Jaramillo	High	Rich	82.76	*	73.47	*
<i>Otoba parvifolia</i> (Markgr.) A.H. Gentry	High	Rich	89.29	*	77.78	*
<i>Phytelephas macrocarpa</i> Ruiz & Pav.	High	Rich	43.96	NS	45.71	NS
<i>Pouteria torta</i> (Mart.) Radlk.	High	Poor	74.29	*	64.29	NS
<i>Protium nodulosum</i> Swart	High	Rich	32.65	NS	38.1	NS
<i>Rinorea lindeniana</i> (Tul.) Kuntze	High	Poor	28.57	NS	38.1	NS
<i>Rinorea racemosa</i> (Mart.) Kuntze	High	Poor	85.71	**	85.71	**
<i>Senefeldera skutchiana</i> Croizat	High	Poor	71.43	*	71.43	*
<i>Tetrathylacium macrophyllum</i> Poepp.	High	Rich	80	**	73.47	*
<i>Trymatococcus amazonicus</i> Poepp. & Endl.	High	Poor	53.06	NS	45.71	NS
<i>Virola calophylla</i> (Spruce) Warb.	High	Poor	85.11	**	58.33	NS
<i>Virola pavonis</i> (A. DC.) A.C. Sm.	High	Poor	71.43	*	71.43	*
<i>Brosimum utile</i> (Kunth) Oken ex J. Presl	Low	Poor	24.49	NS	25.71	NS
<i>Carpotroche longifolia</i> (Poepp.) Benth.	Low	Rich	33.33	NS	25.71	NS
<i>Casearia fasciculata</i> (Ruiz & Pav.) Sleumer	Low	Poor	21.43	NS	25.71	NS
<i>Conceveiba rhytidocarpa</i> Müll. Arg.	Low	Rich	30.77	NS	28.57	NS
<i>Diclinanona tessmannii</i> Diels	Low	Poor	71.43	*	71.43	*
<i>Drypetes amazonica</i> Steyerem.	Low	Rich	59.52	NS	59.52	NS
<i>Eschweilera gigantea</i> (R. Knuth) J.F. Macbr.	Low	Rich	40.82	NS	38.1	NS

<i>Eschweilera rufifolia</i> S.A. Mori	Low	Poor	35.16	NS	28.57	NS
<i>Euterpe precatoria</i> Mart.	Low	Poor	38.1	NS	38.1	NS
<i>Guarea pterorachis</i> Harms	Low	Rich	65.48	*	59.52	NS
<i>Hirtella racemosa</i> Lam.	Low	Poor	52.38	NS	45.71	NS
<i>Inga alba</i> (Sw.) Willd.	Low	Rich	50	NS	45.71	NS
<i>Inga pruriens</i> Poepp.	Low	Rich	21.43	NS	25.71	NS
<i>Iryanthera macrophylla</i> (Benth.) Warb.	Low	Poor	46.75	NS	38.1	NS
<i>Licania macrocarpa</i> Cuatrec.	Low	Poor	25.71	NS	25.71	NS
<i>Macrobium limbatum</i> Spruce ex Benth.	Low	Poor	52.75	NS	45.71	NS
<i>Matisia bracteolosa</i> Ducke	Low	Poor	25.71	NS	25.71	NS
<i>Minquartia guianensis</i> Aubl.	Low	Poor	23.81	NS	21.43	NS
<i>Naucleopsis ulei</i> (Warb.) Ducke	Low	Rich	28.57	NS	32.65	NS
<i>Ophiocaryon heterophyllum</i> (Benth.) Urb.	Low	Poor	23.38	NS	21.43	NS
<i>Pachira insignis</i> (Sw.) Sw. ex Savigny	Low	Rich	47.62	NS	45.71	NS
<i>Pourouma cecropiifolia</i> Mart.	Low	Poor	27.27	NS	32.65	NS
<i>Pseudolmedia laevigata</i> Trécul	Low	Poor	64.29	*	59.52	NS
<i>Pseudolmedia laevis</i> (Ruiz & Pav.) J.F. Macbr.	Low	Rich	64.29	NS	59.52	NS
<i>Roucheria punctata</i> (Ducke) Ducke	Low	Poor	71.43	*	71.43	*
<i>Ryania speciosa</i> Vahl	Low	Rich	50.79	NS	45.71	NS
<i>Siparuna cristata</i> (Poepp. & Endl.) A. DC.	Low	Rich	32.14	NS	25.71	NS
<i>Socratea exorrhiza</i> (Mart.) H. Wendl.	Low	Poor	45.71	NS	38.1	NS
<i>Sorocea hirtella</i> Mildbr.	Low	Rich	51.95	NS	51.02	NS
<i>Tetragastris panamensis</i> (Engl.) Kuntze	Low	Rich	43.96	NS	38.1	NS
<i>Tetrastylidium peruvianum</i> Sleumer	Low	Poor	23.81	NS	21.43	NS
<i>Theobroma obovatum</i> Klotzsch ex Bernoulli	Low	Poor	24.49	NS	25.71	NS
<i>Theobroma subincanum</i> Mart.	Low	Poor	44.44	NS	38.1	NS
<i>Virola duckei</i> A.C. Sm.	Low	Rich	30	NS	25.71	NS
<i>Virola multinervia</i> Ducke	Low	Rich	21.43	NS	25.71	NS
<i>Virola peruviana</i> (A. DC.) Warb.	Low	Poor	25	NS	25.71	NS

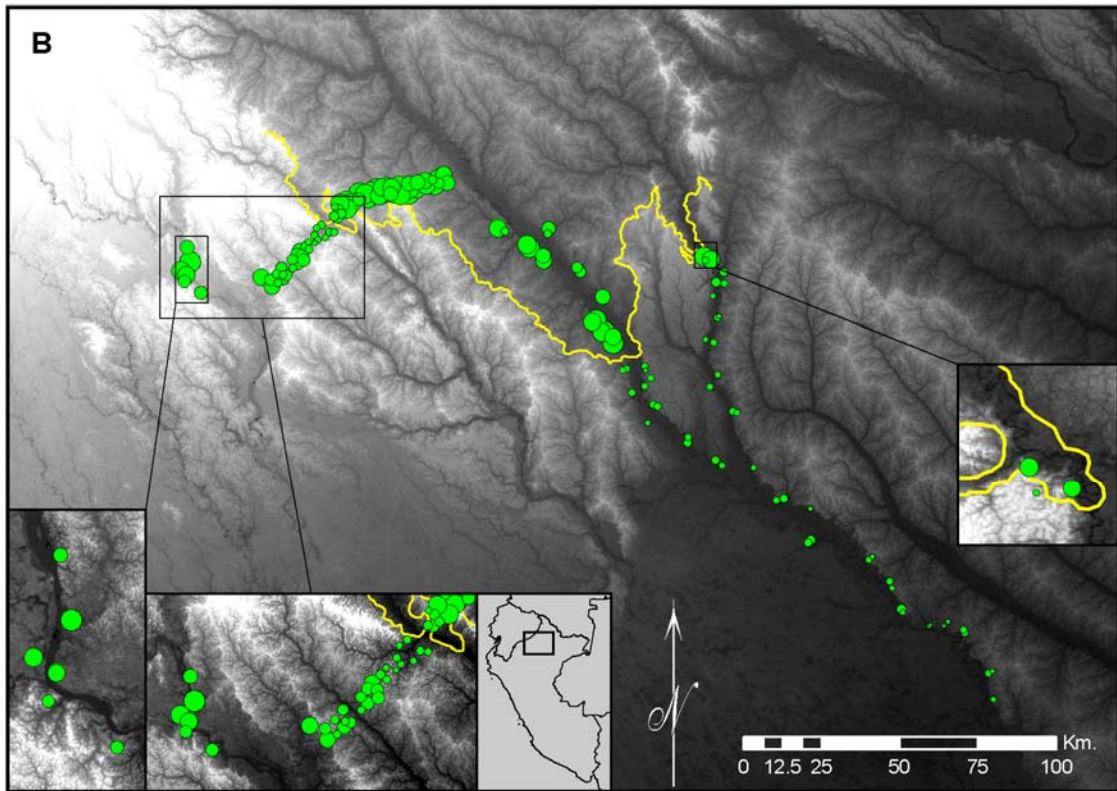
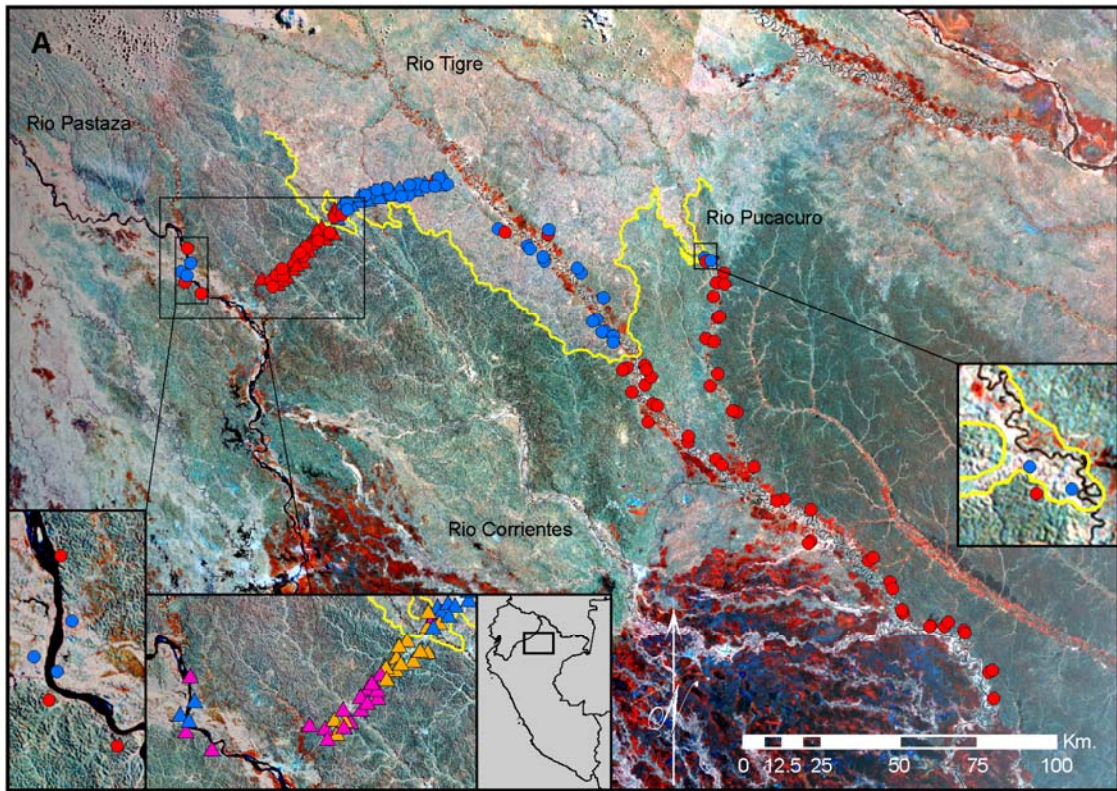
Table sorted by abundance and then by species

<sup>1</sup> Average abundance of species: "High" indicates  $\geq 1$  individual per plot; "Low" indicates  $< 1$  individual per plot.

<sup>2</sup> Group of plots for which the highest IV (indicator value) was obtained: "Rich" indicates group with  $> 2.09$  cmol(+)/kg sum of cations; "Poor" indicates group with  $< 2.09$  cmol(+)/kg sum of cations

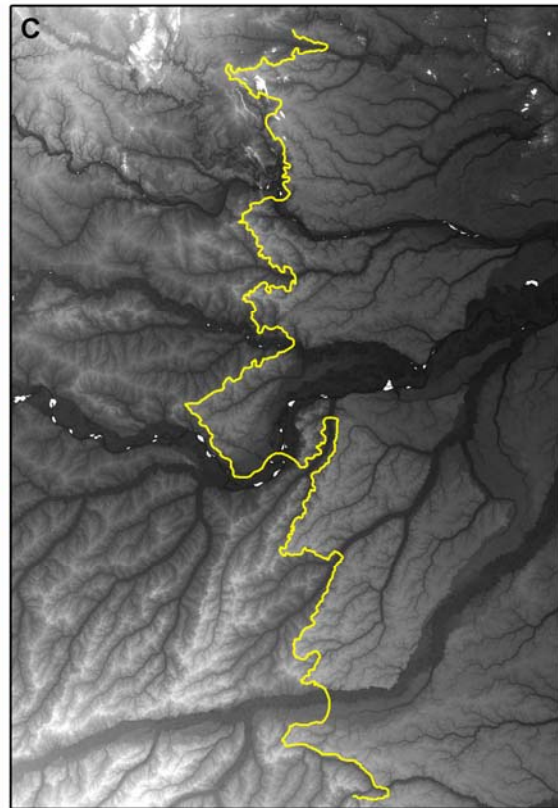
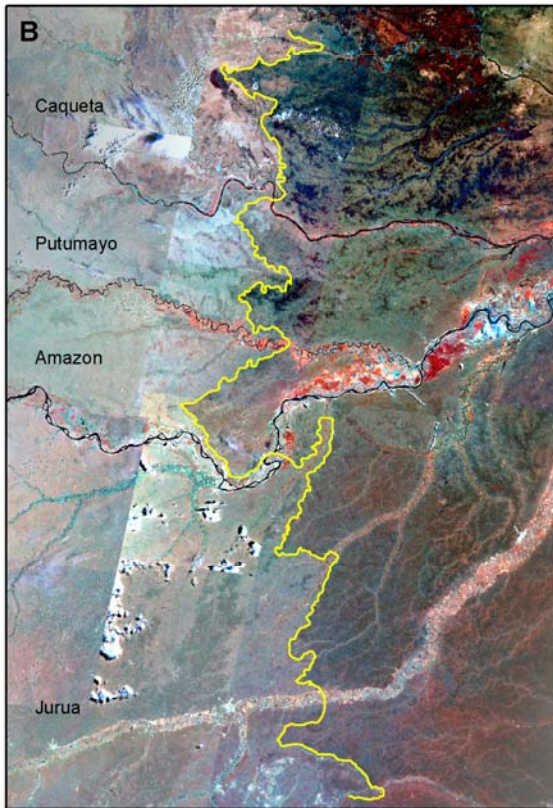
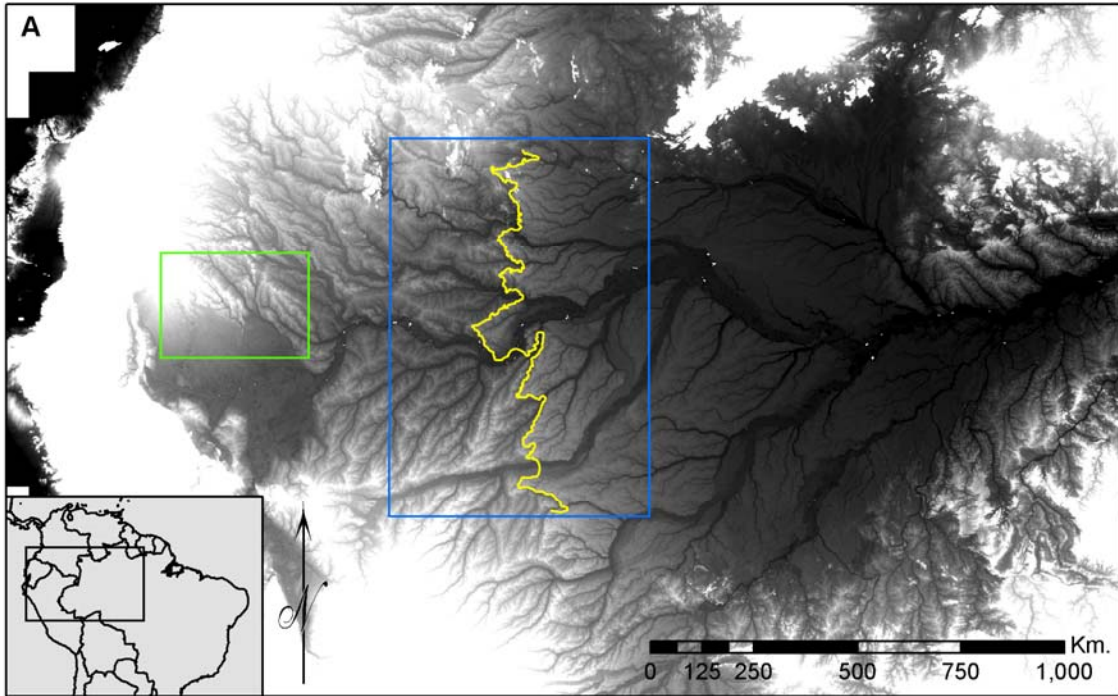
<sup>3</sup> Importance value

<sup>4</sup> Statistical significance of indicator value (IV): NS =  $p > 0.05$ ; \* =  $p < 0.05$ ; \*\* =  $p < 0.01$ ; \*\*\* =  $p < 0.001$

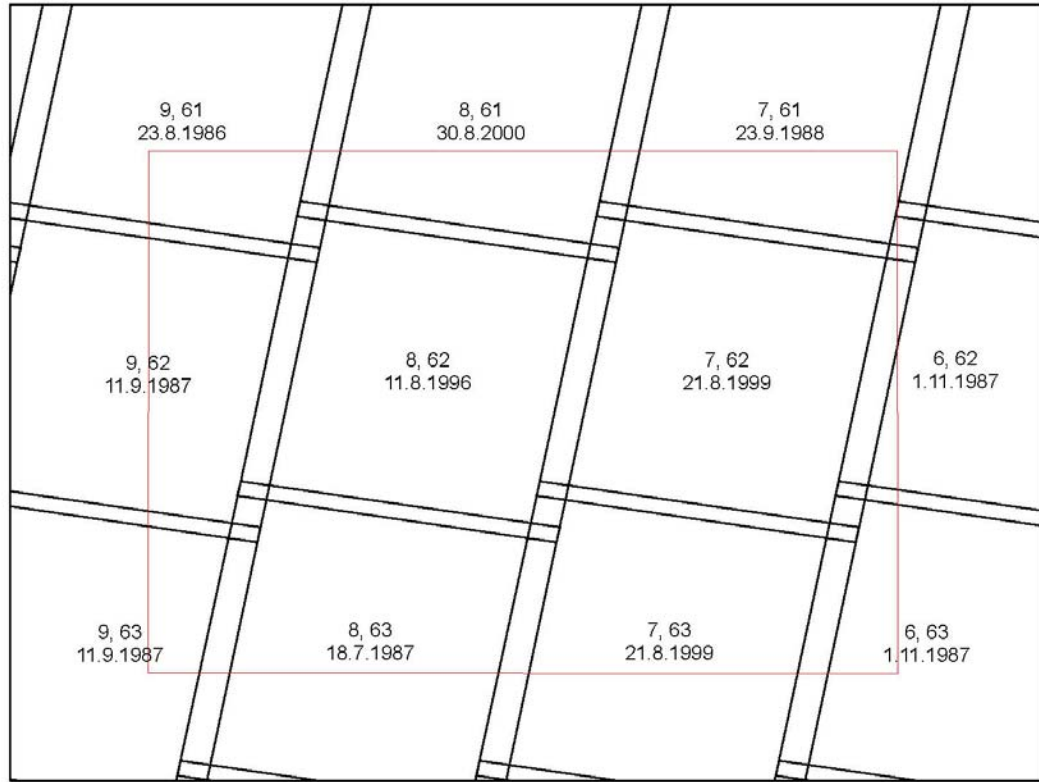




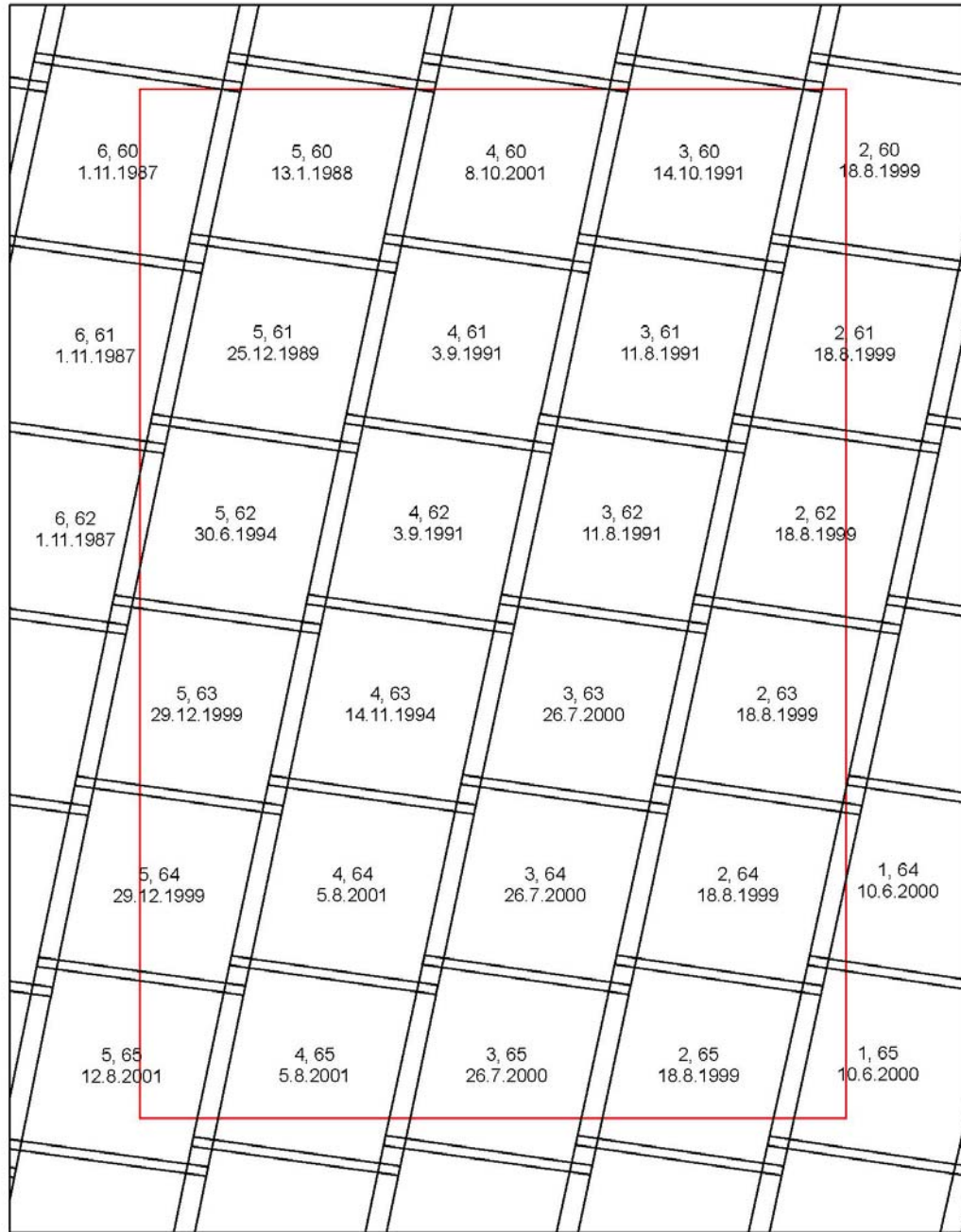
**Figure 7: Relationship between remotely-sensed discontinuity, plant species composition, and soil cation concentrations. Yellow line indicates the discontinuity identified in Landsat (A) and SRTM (B) data, between the Miocene Pebas Formation (north of discontinuity) and Late-Miocene Nauta Formation (south of discontinuity). From left to right, insets show detail of Pastaza Fan; detail of northwest of study area; location of study area; and detail of the upper Pucacuro river. (A), Results of floristic clustering analyses superimposed upon Landsat mosaic for study area. Circles indicate transects with both pteridophyte and Melastomataceae inventories, and triangles indicate transects with only pteridophyte inventories. The color of a transect indicates its classification by clustering analysis, which was used to generate two groups (main figure) or four groups (center-left inset). For the latter, a group of three inventories restricted to the southeast of the study area is not displayed. (B), Soil cation concentrations superimposed upon a SRTM digital elevation model for the study area. Diameter of circles is proportional to the log-transformed sum of the concentrations of four cations (Ca, Mg, Na, and K). Light tones in the digital elevation model indicate higher elevation, and dark tones lower elevation. Maximum elevation in the study area is 433m, and minimum is 98m. Dark-red tones in Landsat imagery (A) along rivers and in the south of the study area indicate inundated forest or swamp; and white patches in northwest and north of study area are clouds.**



**Figure 8: Boundary between Miocene and Late Miocene-Pleistocene sediments, relative to continent-scale SRTM and Landsat mosaics. Boundary is indicated by yellow line and divides dissected Miocene Pebas sediments in the west from planar Late Miocene-Pleistocene sediments in the east. (A), SRTM digital elevation model for Amazonia. Light tones indicate higher elevation and dark tones lower elevation. Green box indicates the extent of figure 7, blue box indicates the extent of figures 2B and C, and inset indicates location relative to South America. (B), Landsat mosaic for the area indicated by blue box in A, with major rivers labeled. (C) SRTM digital elevation model for the same area for same area as B. Maximum and minimum elevations in A are 6157m and 0m, and in C are 779m and approximately 40m.**



**Figure 9: Landsat data used for Figure 7. Black outlines represent image areas, and red outline indicates mosaic area. Top value for each image indicates path and row combination for the image, and bottom value indicates day, month, and year.**



**Figure 10: Landsat data used for Figure 8. Black outlines represent image areas, and red outline indicates mosaic area. Top value for each image indicates path and row combination for the image, and bottom value indicates day, month, and year.**

## **Chapter 5. Geological control of floristic composition in western Amazonia**

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### ***Introduction***

Western Amazonia contains the largest remaining tract of undisturbed tropical forest on earth, and is thus critical to international nature conservation and carbon sequestration efforts. The physical and technical challenges of access to this vast and remote area, however, have limited efforts to produce the accurate, high-resolution biodiversity maps needed for conservation and development purposes (Margules and Pressey 2000, Noss et al. 1999). As a result, biological survey in western Amazonia remains in what John Terborgh has termed “the stone age” (Terborgh 1992). Intensive, multi-taxa inventories are available for some areas (Pitman et al. 2003), but large-area maps are generally based on surrogate environmental variables or expert opinion rather than field data (Dinerstein et al. 1995). Accurate map data, supported by a firm understanding of the causes of floristic patterns, are critical for both the study and conservation of Amazonian forests

It is well-known that soil properties regulate floristic composition in both temperate and tropical forests. In American temperate forests, soil properties have been demonstrated to control both the composition of climax stands and the convergence of those stands during the successional process (Christensen and Peet 1984). Within the tropics, soil properties have been found to exert strong control over composition at sites ranging from central America, to southeast Asia, to the vast expanses of Amazonia (Duivenvoorden 1995, Duque et al. 2009, Honorio et al. 2009, John et al. 2007, Palmiotto et al. 2004, Phillips et al. 2003, Salovaara 2004, Tuomisto et al. 2003c). Within Amazonian forests, these changes in soil properties have been argued to result in long-distance and possibly abrupt changes in floristic composition, driven by the Andean orogeny (Pitman et al. 2008, Ter Steege et al. 2006). This raises the possibility that underlying geological processes may regulate floristic composition in Amazonia, and that this may provide a general model for floristic patterns in these forests (Ter Steege et al. 2006, Pitman et al. 2008, Tuomisto et al. 1995). This hypothesis has been difficult to test, however, due to a lack of large-area but detailed geological, edaphic, and floristic datasets.

Here we sought to study the relationship between geological formations and plant species composition in western Amazonia, and to use available data to map these patterns. It has long been thought that soils in western Amazonia reflect a transition from older, more weathered soils in eastern Amazonia, derived from the ancient Brazilian and Guyanan Cratons; to younger, richer soils in the west, derived from recent

Andean erosion (Irion 1984). This has been proposed as the main explanation for an observed west-east gradient in plant family and genus composition across Amazonia (ter Steege et al. 2000, ter Steege et al. 2006, Pitman et al. 2008). Geological studies, however, have found that widespread sediments in western Amazonia (i.e. the Pebas Formation) predate those in central Amazonia (i.e. the Içá Formation) by millions of years (Räsänen et al. 1990, Rossetti et al. 2005). This inconsistency demonstrates the need to integrate geological and ecological studies in these forests.

Edaphic patterns in western Amazonia reflect a complex history of deposition and erosion, dating to the Miocene and driven by the Andean orogeny. Early stages of the Andean uplift, during the early to middle Miocene (c. 25 to 12 mya), caused the formation of the Pebas embayment and the deposition of the Pebas Formation (equivalent to the Brazilian Solimões Formation). The Pebas formation is distributed across western and central Amazonia, and consists of poorly-weathered and cation-rich clay sediments deposited during low-energy semi-marine or lacustrine conditions in the early to middle Miocene (c. 25 to 12 mya; Räsänen et al. 1995, Wesselingh et al. 2002). During this time, western Amazonian forests drained predominantly towards the northwest, though a southern connection to the Atlantic has also been proposed (Hovikoski et al. 2005).

Due to further uplift during the Late Miocene-Pleistocene (c. 12 mya to recent), the Pebas embayment drained and was replaced by an environment dominated by



continental fluvial or deltaic deposition, during which time the drainages of the Amazonian lowlands shifted to their contemporary eastwards course (Räsänen et al. 1990, Figueredo et al. 2009, Räsänen et al. 1987). Under these high-energy conditions, the Pebas Formation was overlain by sandy, easily-weathered, and cation-poor sediments, such as the Nauta Formation in western Amazonia and the Içá Formation in central Amazonia (Schobbenhaus et al. 2004, Rebata et al. 2006).

Continued uplift during the Plio-Holocene (c. 5-recent mya) has caused drainage incision along much of the Andean foreland, replacing depositional dynamics with erosion (Räsänen et al. 1992; though broad zones of deposition remain, see Räsänen et al. 1990 and 1992). This has removed the more friable and cation-poor Late Miocene-Pleistocene deposits across much of western Amazonia, and exposed vast expanses of the buried, cation-rich Pebas Formation (Räsänen et al. 1990, INGEMMET 2000, Roddaz et al. 2005). Late Miocene-Pleistocene sediments are largely preserved in central Amazonia, however, where they are represented by the Içá Formation.

The exposure of the Pebas Formation across western Amazonia is not complete, however, due to the uneven nature of this uplift and river incision. As a result, mesa-like islands of poorer Late Miocene-Pleistocene deposits remain across western Amazonia, elevated above the Miocene Pebas matrix (Figs.1, 2; Räsänen et al. 1990, INGEMMET 2000). This dichotomy between older, richer-soil Pebas Formation matrix, and younger

but poorer Late Miocene-Pleistocene is a defining feature of contemporary western Amazonia, but its implications for the western Amazonian biota is poorly known.

Due to the strong relationship between soil properties and species composition, we hypothesize that edaphic differences between the exposed Pebas Formation and the overlaid islands of more recent sediments will be reflected in the composition of the corresponding vegetation. This would indicate that western Amazonia exhibits large-scale patch-matrix dynamics, with possible implications for community assembly in these forests. Furthermore, the transition through geological time-scales from a landscape dominated by nutrient-poor Late Miocene-Pleistocene sediments, to a landscape dominated by richer Pebas sediments, could provide a powerful mechanism for evolution of the western Amazonian biota. Last, this patch-matrix configuration would have obvious implications for conservation planning in western Amazonia.

To study the relationship between geological and floristic patterns in western Amazonia, we used a novel combination of SRTM (Shuttle Radar Topography Mission) elevation data (Rodriguez et al. 2006), Landsat Geocover imagery (Tucker et al. 2004), and plant and soil sampling to solve the longstanding lack of geological, edaphic, and floristic data for these forests. Geological formations can be identified from the geomorphological patterns in SRTM digital elevation data (Rossetti and Valeriano 2007), and patterns in plant species composition can be identified from Landsat data (Tuomisto et al. 1995, Tuomisto et al. 2003a, Tuomisto et al. 2003b, Salovaara et al. 2005,

Thessler et al. 2005). Matched patterns in these datasets would thus indicate geological control of floristic patterns. This hypothesis can be tested by plant and soil sampling. The SRTM and Geocover datasets are particularly useful as they provide global and georectified elevation data and Landsat imagery at no cost. These methods thus offer tools that can be used in Amazonia and beyond to map patterns in poorly studied but globally important tropical forests.

## ***Methods***

### **Study area**

Our study site was located in northwestern Amazonia, at the headwaters of the Curaray, Arabela, and Pucacuru rivers (Figures 11 and 12; approximately 75.30°W and 1.8°S). This region is exceptionally poorly-known due to its extreme remoteness and lack of large rivers, and has been identified as a conservation priority by the World Wildlife Fund (Dinerstein et al. 1995). Access to sites was provided by helicopter during seismic exploration of the Bloque 39 petroleum concession. These activities did not impact the sites in which data was collected, however, and the study area represents undisturbed lowland tropical rainforest. There is no distinct dry season in this region and annual rainfall averages 2500–3000 mm. During our study period from April through August

2008 monthly rainfall averaged 256 mm (range: 119–465 mm), and monthly daytime minimum and maximum temperatures averaged 20° and 32 ° C, respectively, with little variation between months. Elevation in the study area ranged from 120 to 320 meters, with a mean elevation of 200 meters.

Geological maps for Peru and SRTM imagery indicate a widespread contrast in northwestern Amazonia between elevated, mesa-like islands of Late Miocene-Pleistocene sediments, and the surrounding and underlying Miocene Pebas Formation (INGEMMET 2000). Our study area is typical in this regard, and contains a number of islands of the Late Miocene-Pleistocene Nauta formation, surrounded by the lower-elevation Pebas matrix. We sampled this area in order to collect plant and soil data from both these Nauta Formation islands and the Pebas Formation matrix. Transects were placed to avoid tree-fall gaps and streams, and were not located in white sands or inundated areas such as floodplains. As such our sampling focuses on the clay, terra-firme soils that cover the majority of the Amazonian lowlands.

## **Satellite imagery acquisition and interpretation**

We used Landsat Geocover imagery to identify potential floristic patterns in our study areas (Tucker et al. 2004). Imagery was downloaded from the Global Landcover Facility (GLCF, University of Maryland, USA, <http://glcf.umiacs.umd.edu>) and used to

construct image mosaics for each of the study areas. Geocover imagery has the advantages of being publicly-available and orthorectified, thus eliminating the challenge of collecting ground control points in these remote forests and greatly improving positional accuracy. These benefits make this imagery uniquely suited to studies of remote Amazonian forests by agencies for which funding is limited.

Two to three images are available for each path/row combination in the Geocover dataset, and we selected the image that was either least cloudy or of the same date as neighboring images (Figure 13). As recommended by Tuomisto et al. (2003a) we used bands four, five and seven of the original Landsat images to construct our mosaics. All images were first subset to the extent of the final mosaic area and then assembled sequentially to produce the final mosaic. Image area containing clouds was removed from the northwestern corner and southwestern edge of the image for path 8, row 62 prior to mosaic construction.

Once assembled, our final mosaic was processed uniformly to improve interpretability by contrast stretching and low-pass spatial convolution (image smoothing), as recommended by Hill and Foody (1994) and Tuomisto et al. (1994). All of the preceding operations were conducted in Erdas Imagine v. 8.7 (Leica Geosystems GIS & Mapping LLC.). We subsequently used ArcGIS v. 9.1 (ESRI Inc.) to remove linear brightness trends from each of the final mosaic bands in order to remove the brightness trend artifact noted by Toivonen et al. (2006). For display and interpretation, bands four,

five, and seven were assigned to red, green, and blue, respectively. Image interpretation was performed manually by MH. Interpretation was first conducted solely from Landsat imagery, and SRTM imagery was then used to refine this interpretation in case of ambiguity in the Landsat imagery.

We also used shuttle radar topography mission (SRTM) digital elevation data (Rodriguez et al. 2006) to identify geological boundaries in our study areas. SRTM data was downloaded from the USGS National Map Seamless Server (<http://seamless.usgs.gov>), and contrast stretches were applied uniformly to maps and insets to improve interpretability. To calculate the mean elevation for each transect (see below), we used ArcGIS v 9.1 to buffer the transects to 200m such that the buffers were 400m in width and 900m in length, with rounded ends. We then used ArcGIS to calculate the mean value of all SRTM pixels located within the buffers (from an average of 38 pixels per transect). These values were then used for subsequent analyses. We last used the results from CART analyses (see below) to generate maps of predicted vegetation based on our SRTM imagery. To do this we thresholded the SRTM image for the study area by the value identified in the CART analysis.

## **Field data collection**

We inventoried Pteridophytes (ferns and fern allies) and collected soils at 52 sites in the vicinity of the Rio Curaray, Peru, using 5 m by 500 m linear transects (Figure 14; Tuomisto et al. 2003a, Tuomisto et al. 2003c). Pteridophytes reveal most of the floristic pattern captured by traditional tree inventories with a much smaller time investment (Tuomisto et al. 1995, Ruokolainen et al. 1997, Ruokolainen et al. 2007). We situated these transects so as to represent the range of tones observed in our Landsat imagery, and transect placement was stratified by our initial assessment of the geological features in the study area (i.e. Nauta islands versus Pebas matrix). To conduct our plant inventories, we opened a narrow path along the center of each transect, and recorded all species we observed to 2.5m on both sides of this path as we walked the transect. Only individuals rooted within a height of 2m and with at least one leaf longer than 10cm were included in the inventories. Climbers or epiphytes with no green leaves less than 2m above ground were not included. The product of this process was presence-absence data for pteridophytes. Voucher collections for all species were deposited in herbaria in Peru (AMAZ) and Finland (TUR).

At three points along each transect (approximately 50m, 250m, and 450m) we also collected soil samples. Each soil sample consisted of five subsamples collected within an area of 5 x 5m and pooled in the field. Equal dry weights of the three samples were then combined to yield a single sample for each site. These samples were processed at a single laboratory (MMT Agrifood, Jokionen, Finland), and analyzed for pH; loss on

ignition (LOI; a proxy for content of organic material in the soil); concentrations of P, Al, Ca, K, Mg, and Na; and percentage of sand, silt, and clay.

## **Data analyses**

The objectives of our analyses were (1) to test the association between floristic patterns and soil properties our study area; (2) to test the association between these patterns and geological formations; and (3) to use the relationships between geological formations and species composition to model species composition throughout our study area.

To visualize the floristic patterns in our study area, we performed clustering analysis with our pteridophyte transects. For clustering analysis, distance matrices were calculated using the Jaccard index, and clustering groups were generated using the group-averaging method (UPGMA; PC-ORD v 4.41; MjM Software). We used indicator species analysis (Dufrene and Legendre 1997; species present in eight or more transects,  $P \leq 0.05$ ) to test the relationship between individual plant species and the clustering groups.

We also used non-metric multidimensional scaling (NMDS) to visualize plant compositional patterns in our study area, and to extract dominant compositional trends for comparison to both elevation and edaphic properties (i.e. indirect gradient analysis).



Ordination methods such as NMDS allow variations in community composition across hundreds of species to be represented in two or three axes, such that the distance between sites along these axes is representative of their differences in species composition. We chose this approach because it can reduce noise in datasets, and because it yields a small number of compositional variables for comparison to environmental variables. We specifically chose NMDS because it makes no assumptions about relationships between variables (i.e. species), and in particular does not assume linear relationships between species occurrences.

For our NMDS calculations, we used PC-ORD (NMS; PC-ORD v 4.41; MjM Software) to identify the optimum number of NMDS dimensions for our dataset; calculate a solution at this dimensionality; and apply a varimax rotation to this solution. This last step rotates the NMDS point cloud such that the dominant compositional trend is aligned with one of the ordination axes, thus facilitating comparison of these axes to environmental variables. This technique does not change the relative distances between plots in the NMDS ordination and thus does not alter the NMDS solution. The Jaccard index was used to calculate compositional distance between sites, and we ran 400 iterations total, with a stability criterion of 0.00001. We last calculated the correlation between distances in the ordination space, measured by Euclidean distance, and the original distance matrix, measured with the Jaccard index. This provided a measure of the percent variation in the original dataset explained by the ordination axis.

To study the relationship between species composition and soil properties, we used three approaches. We first calculated the correlation between our ordination axes and individual environmental variables using simple linear regression. For this analysis we used 12 environmental variables: pH; LOI; log-transformed concentrations of P, Al, Ca, K, Mg, and Na; percentages of sand, silt, and clay; and mean elevation, as calculated from our SRTM data (see above). We additionally used the log-transformed sum of four cations, Ca, MG, Na, and K, as these variables are known to covary in western Amazonian soils (Tuomisto et al. 2003a), and because this provides a single measure of soil cation concentrations. We log-transformed cation concentrations in order to give greater weight to changes in cation availability at low concentrations than at high concentrations, as recommended by Phillips et al. (2003) and Tuomisto et al. (2003a). This treatment better reflects the response by plants to these nutrients than does equal treatment across concentrations. We also used mean elevation for each transect as a surrogate for geological formation.

Second, to confirm the results of these analyses, we used Mantel tests (PC-ORD v 4.41; MjM Software) to calculate correlations between these individual environmental variables and floristic composition. For these tests, we also included log-transformed geographic distance between sites in order to measure the effects of dispersal on composition. We log-transformed geographic distance, in accordance with Condit et al (2002), as this better reflects the impact of dispersal limitation on plant composition. The

Mantel test calculates the correlation between pairs of dissimilarity matrices calculated from floristic or environmental variables. Dissimilarity matrices are square and symmetric, such that each cell in a matrix represents the dissimilarity between a pair of sites for a given variable. Dissimilarities between sites were calculated with Euclidean distance for environmental variables, and with the one-complement of the Jaccard index for our Pteridophyte data. The Mantel test was then used to calculate the Pearson's correlation coefficient ( $r$ ) between pairs of matrices, and the significance of this correlation was determined by 999 permutations.

It is important to note that, due to a loss of information during the transformation from raw data to distance matrices, Mantel tests give lower correlation coefficients than linear regressions in cases where both can be calculated on the same data. These methods usually agree, however, on whether the correlation is significant (Legendre 2000, Tuomisto et al. 2003a). We thus expect lower correlation coefficients for our Mantel tests than linear regression against our ordination axes, and this effect may be amplified by the reduction of noise along these axes.

Third, to identify the environmental variables that best explained the floristic patterns in our study area, and to calculate the amount of floristic variation explained by these variables, we used multiple regression on distance matrices. As for our Mantel tests, distance matrices for environmental variables were calculated using Euclidean distance, and the matrix for our floristic data (Pteridophyte presence-absence data) was

calculated using the one-complement of the Jaccard index. To construct our multiple regression models, we began with a model that included matrices for all variables, and then used stepwise backwards elimination to exclude the environmental distance matrix with the least significant contribution to floristic distance, as calculated by a permutation test with 999 permutations. This process was repeated until all variables left in the model had regression coefficients with  $P < 0.05$  after Bonferroni correction (see Legendre et al. 1994). All multiple regressions on distance matrices were calculated with Permute 3.4 (alpha version; Legendre et al. 1994). For this analysis, we included all variables used in our Mantels tests, with the exception of elevation, which does not directly control composition. We also did not initially use the log-transformed sum of cations, which would be redundant with the individual cations.

To study the relationship between geological formation, soil properties, and floristic composition, we used elevation as a surrogate for geological formation, and calculated simple linear regressions between elevation and floristic composition (measured by NMDS axis I as a single, continuous variable) or the soil properties identified above.

To model composition in our study area on the basis of geological formation, again represented by elevation, we used the two groups identified by our clustering analysis in a CART (classification and regression tree; JMP v. 8, SAS Institute Inc.; Vayssières et al. 2000) analysis, in order to identify the single elevation threshold that

best divided the two groups. We validated this model using a leave-one-out validation method (equivalent to k-fold validation, with k=52), in which 51 of the 52 sites were used to identify the elevation threshold, and this was used to predict the group membership of the remaining site. The elevation threshold was then used to classify the SRTM data for our study area into the two floristic groups. We conducted similar analyses with a subset of environmental variables to identify single thresholds in those variables that might correspond to the threshold in elevation.

## ***Results***

### **Satellite image interpretation**

Inspection of our Landsat and SRTM imagery revealed two primary terra-firme features: darker tones in our Landsat imagery corresponding to higher-elevations islands; and a lighter-toned, lower-elevation matrix (Figures 11 and 12). We delineated these islands and matrix manually from our imagery, and from comparison to national geological maps found that they corresponded approximately to islands of the Late Miocene-Pleistocene Nauta Formation, and the underlying and surrounding Pebas Formation (INGEMMET 2000, Rebata et al. 2006; Figure 25). Analysis of SRTM imagery indicates that the Curaray, Arabela, and Pucacuru rivers are removing these Nauta

Formation sediments to expose the Pebas Formation beneath, such that the Nauta Formation remains only as highlands in the interfluvial zones between these rivers. This suggests that these islands are remnants of a once widespread Nauta Formation, now greatly reduced in area.

Also visible in our Landsat imagery are large expanses of varzea, or flooded forest, visible as low-elevation areas of bright red tones along the Curaray, Arabela, Pucacuru, and Tigre rivers. Due to our focus on variation in terra-firme forest, these patches were excluded from sampling. Also visible in our Landsat imagery was a patch of clouds in the center of our image mosaic, and this area was also excluded from sampling.

## **Data analyses**

We encountered a total of 127 species of pteridophytes and an average of 30 species per transect. Clustering analysis of the plant transects produced two floristic groups, corresponding closely to the Nauta Formation islands and Pebas Formation matrix (Figure 15). The average species turnover between transects from different groups was 77% (versus 59% within; calculated as the one-complement of the Jaccard index), and 66% of the fern species were significantly associated with one of the two groups (indicator species analyses, Table 14).

Cation concentrations (sum of Ca, Mg, Na, and K) at lower elevations (the Pebas Formation), were substantially greater than those at higher elevations (the Nauta Formation islands; Figure 16). On average, cation concentrations in the group of sites corresponding to the Pebas Formation were over seven times greater than in the group corresponding to the Nauta Formation (t-test,  $P < 0.0001$ ). Overall, cation concentrations (sum of Ca, Na, Mg, and K) in the study area ranged from 0.37 to 21.26  $\text{cmol}^{+}/\text{kg}$ , on the same order of magnitude as variations found across Amazonia (Table 15; Sanchez and Buol 1974, Botschek et al. 1996).

NMDS ordination of our floristic data yielded two axes (Figures 17 and 18) which explained 87% of the variation in the original plant dataset. Of the variation in the original dataset, 77% was explained by axis I, and 10% by axis II. This ordination corresponded strongly with our clustering groups, which divided the ordination space into two non-overlapping groups (Figure 18).

Almost all of the soil variables were significantly associated with axis I of the NMDS. The four variables most strongly correlated with this axis were log-transformed concentrations of Mg, Ca, and K, and percent clay (Table 16; excluding sum of cations and elevation). These correlations were confirmed by Mantel tests, in which distances calculated from concentrations of Mg, Ca, K, and percent clay and silt, correlated best with floristic distances. Correlations between axis II and environmental variables were generally not significant ( $P \geq 0.01$ ), with the exception of weak relationships with log-

transformed K and percent silt. Given the small amount of floristic variation captured by this axis, and this lack of explanatory variables, we did not include it in later analyses.

Backwards regression of soil variables on floristic distance yielded a model that explained 52% of floristic composition and retained log-transformed concentrations of K and Mg, and percent clay. Our Mantel tests indicated a small but significant relationship ( $r^2 = 0.04$ ) between geographic distance and floristic composition, and adding log-transformed geographic distance to the set of initial variables resulted in a model that retained geographic distance. This model, however, explained only an additional one percent (53% total) of variation in floristic distance, indicating that dispersal limitation is relatively insignificant in the study area, and that the effects of geographic distance are due to spatial structuring of our soil variables.

These analyses consistently showed strong relationships between floristic composition, and at least four variables: log-transformed concentrations of Mg, Ca, and K, and percent clay. The majority of the soil variables, however, were significantly correlated with other variables (Table 17), making it difficult to identify which variable or combination of variables is responsible for compositional patterns. Generally, however, our sample sites were characterized either by high cation concentrations (Mg, Ca, K, and Na), higher pH, and higher silt content; or by low cation concentrations, high clay content, and greater quantities of organic matter (measured as LOI). These characteristics corresponded closely to the Pebas Formation and Nauta Formation



clustering groups, respectively (see Figure 18 for examples for cation concentrations and percent clay).

To partially solve the problem of correlation between soil variables, we used the log-transformed sum of concentrations of Ca, Mg, Na, and K as a single measure of cation availability, consistent with previous studies (Tuomisto et al. 1995, Tuomisto et al. 2003a). To test the usefulness of this measure, we repeated our regression analysis of soil properties on floristic composition with the log-transformed sum of cations substituted for concentrations of Ca, Mg, Na, and K. This analysis generated a model that explained 45% of floristic variation and retained only sum of cations and percent clay as predictor variables. A multiple regression model using both sum of cations and percent clay furthermore predicted 80% of the variation along NMDS axis I. We thus concentrated the remainder of our analyses on these two variables. Individually, the log-transformed sum of cations and percent clay explain 72% and 36% of variation in NMDS axis I, respectively, and 31% and 19% of floristic distances in Mantel tests (Table 16). The Nauta Formation group exhibits uniformly low cation concentrations and a wider range of clay content, while the Pebas Formation group exhibited a wide range of both cation concentration and clay content (Figures 19 and 20).

Elevation was significantly correlated both with floristic composition and with these two variables, confirming that geological formation plays an important role in determining both soil properties and floristic composition. Variations in elevation

explain 36% of the variation in NMDS axis I, and 11% of floristic distance in Mantel tests (Table 16). Elevation also separates the two clustering groups, such that lower elevations correspond primarily to Pebas Formation sites and higher elevations to Nauta Formation sites (Figure 21). On average, these two groups differ in elevation by 34 meters. Variations in elevation furthermore explain 11% of the variation observed in cation concentrations and 38% of the variation in percent clay content, such that higher-elevation sites in the Nauta Formation have lower cation concentrations and higher clay contents than lower-elevation sites in the Pebas Formation (Figures 22 and 23).

The relationship between elevation and these variables was more evident when CART analysis was used to identify the elevation, cation concentrations, or clay content that best separated the groups identified by our clustering analysis. CART analysis indicated that an elevation value of  $\geq 251.103$  meters, a log-transformed cation sum of  $\geq 0.0971724$  cmol[+]/kg, and a percent clay of  $\geq 59.4\%$ , best defined the clustering groups. Classifying the transects based on these thresholds yielded very similar results: elevation-defined groups differ from cation-defined groups in only seven of 52 cases (86% match), and from clay-defined groups in only five cases (90% match; Table 18). This indicates that this elevation threshold corresponds closely to these cation and clay thresholds.

Using the elevation threshold of  $\geq 251.103$  meters to classify our SRTM image yielded a classification that closely matched our original image interpretation, and our

floristic and edaphic data (Figure 24). This threshold was robust in our leave-one-out validation analysis, and repeating the CART analysis returned the same threshold in 49 of 52 cases ( $\geq 246.385$  meters returned in two cases,  $\geq 253.222$  meters returned in one case). This elevation threshold correctly classified 46 of 52 transects (89%) into their clustering groups, indicating that the model constructed for our study area is reliable.

## ***Discussion***

### **Overview**

Our findings provide evidence for a dichotomy in northwestern Amazonia between elevated islands of nutrient-poor, Late Miocene-Pleistocene fluvial deposits, and the widespread and nutrient-rich Miocene Pebas Formation matrix. These formations differ seven-fold in soil cation concentrations and substantially in plant species composition. These patterns can be distinguished from Landsat and SRTM satellite data, and can be mapped from SRTM data alone. The existence of a patch-matrix environment in western Amazonia has substantial implications for the ecology of these forests. In addition, the evolution of these dynamics through time has implications for the diversification of the western Amazonian biota. The distinct composition of these

islands make them important targets for conservation, and the methods described here provide a means of mapping them across western Amazonia.

## **Relationships between elevation, soils, and floristic composition**

Consistent with previous studies, we found strong relationships between soil properties and floristic composition in our study area (Tuomisto et al. 1995, Phillips et al. 2003, Tuomisto et al. 2003a, Tuomisto et al. 2003b, Tuomisto et al. 2003c, Salovaara et al. 2004, John et al. 2007). The most important variables were cation concentrations (and particularly concentrations of Mg, Ca, and K), and soil texture (i.e. percent clay), and these together explained a majority of the floristic variation in the study area, whether measured along ordination axes or as compositional distance. Also consistent with these prior studies (Phillips et al. 2003), geographic distance between sites has little influence on floristic composition other than spatial structuring of soil variables. This indicates that, at the distances studied here, dispersal limitation is unimportant or overwhelmed by environmental drivers.

Using elevation as a surrogate for geological formation, we found that these edaphic and floristic patterns are driven by underlying geology. Changes in elevation explain up to a third of the dominant trend in floristic variation as represented by our first NMDS axis. Due to the relatively small average difference in elevation between sites

from the two floristic groups (38m), these changes in floristic composition are unlikely to be due to variations in climate. We instead we expect them to be due to variations in soil properties, and accordingly found significant relationships between elevation and both cation concentrations and clay content. These relationships provide a mechanism by which geomorphology and geological formation are translated into floristic patterns.

These findings suggest a landscape composed of higher-elevation islands of low cation concentrations and high clay content; and a low-elevation surface of high cation concentration and low clay content. Based on interpretation of our SRTM data, and consistent with geological studies (INGEMMET 2000), we conclude that these islands represent remnants of the Late Miocene-Pleistocene Nauta Formation, surrounded by the underlying Pebas Formation, and that the Nauta Formation is being removed due to Andean uplift and subsequent river incision along the Curaray, Arabela, and Pucacuru rivers. This process of incision and erosion is most advanced nearest to these rivers, and least advanced in the interfluvial zones where these islands are located. Consequently, our findings indicate that sampling exclusively along rivers, the common form of transportation in Amazonia, may be insufficient to detect the variety of geological and floristic pattern in western Amazonia.

Due to the relationship between elevation, soil properties, and floristic composition, we were able to use SRTM digital elevation data to model floristic composition in our study area. The maps generated by this process are remarkably

consistent with both our edaphic and floristic data, and existing geological maps (Figure 25). These findings provide support to the combined use of SRTM and Landsat imagery to identify matched geological and floristic patterns in Amazonian forests. Due to large-scale tilt across western Amazonia however, and particularly along the Andean foreland, the elevations used here cannot be used to infer floristic patterns at other sites, and likely cannot be used over large areas. We thus suggest that these methods be used on a region-to-region basis.

Despite strong relationships between elevation and floristic composition, however, the relationship between elevation and cation concentrations is weak. This suggests that variations in cation concentrations reflect more than a simple contrast between Pebas and Nauta Formations. We offer two explanations for this discrepancy. First, erosion by the rivers in the study area does not cleanly remove Nauta sediments from higher elevations, and instead higher-elevations sediments gradually slump into lower elevation drainages, from which they are then removed. This explains the very narrow range of cation concentrations at high elevations (i.e. >250 meters) and large range of cation concentrations at lower elevations.

We second suggest that the change in cation concentrations from the lower-elevation sites to the higher-elevation sites causes a disproportionate change in plant species composition, such that the thresholds observed in elevation, cation concentrations, and clay content, correspond to a state-change in composition. This is

supported by the disproportionate changes in composition relative to cation concentrations above 250m (Figures 21 and 22); by the compositional segregation of higher-elevation plots relative to lower-elevation plots (Figures 17 and 18); and by large floristic variation in the high-elevation Nauta group despite little change in cation concentrations (Figure 19). This implies that the cation-poor, high-elevation islands of the Nauta Formation have a specialized and distinct species assemblage. It may also be the case that an unmeasured environmental variable is acting above 250m to induce this large compositional response, but we cannot suggest what this variable might be.

Last, contrary to our expectations, sites in the Nauta Formation were not characterized by coarse soils typical of fluvial or deltaic deposition. Instead, clay content was substantially greater in Nauta Formation sites and sand content was uncorrelated with composition throughout the study area. This indicates that cation concentrations and soil texture are uncorrelated in our study area, though we do not expect this to be generally true of Amazonian soils. It also suggests that the original Late Miocene-Pleistocene depositional dynamics may have been more varied than we believed, or that these surfaces have been modified since their deposition. For example, greater recent erosion of Pebas sediments may have depleted them of clay relative to the undisturbed Nauta islands. These uncertainties emphasize the need for geological study of these formations.

## Evolution of the western Amazonian biota

Our findings suggest that present-day floristic patterns in northwestern Amazonia reflect the transition since the late Miocene (7 mya to present) from a landscape dominated by nutrient-poor Late Miocene-Pleistocene fluvial or deltaic deposits, such as the Nauta Formation, to a landscape dominated by nutrient-rich deposits of lacustrine or semi-marine origin, such as the Pebas Formation. This transition was the result of uplift at the Andean foreland, river incision, and the gradual removal of Late Miocene-Pleistocene deposits to expose the underlying Pebas Formation. During this period, Late Miocene-Pleistocene deposits shrank from a widespread matrix to isolated islands; while Pebas Formation deposits grew from isolated pockets to the present-day matrix. Pebas Formation sediments continue to be exposed in central Amazonia (see Chapter 4), but the eastern extent of this formation is limited by the original extent of the Pebas embayment to central Amazonia, west of Manaus (Hoorn et al. 1995, Rossetti et al. 2005).

These dynamics have implications for the evolution of the western Amazonian biota, and suggest (1) that Late Miocene-Pleistocene islands in western Amazonia may serve as refugia and possible centers of speciation for taxa that were widespread during the Late Miocene; and (2) that the contemporary species pool of the Pebas Formation may reflect past diversification from poor-soil ancestors in previously isolated patches of



erosion and incision during the Late Miocene. The latter is consistent with the rapid Pleistocene diversification of the rich-soil plant genus *Inga* (Richardson et al. 2001), and the mid Miocene-Pleistocene evolution of clay-associated Burseraceae from species associated with nutrient-poor alluvial deposits (Fine et al. 2005). This is also consistent with the recent divergence of western and eastern Amazonian avian (Bates et al. 1998, Aleixo and Rossetti 2007, Ribas et al. 2009) and primate (Silva and Oren 1996) taxa. Verifying these hypotheses will require targeted sampling of taxa in both Miocene and Late Miocene-Pleistocene surfaces in western Amazonia, and possibly comparison to eastern relatives.

## **Implications for conservation planning**

The existence of islands of poor soils in a richer Pebas matrix in western Amazonia has substantial implications for conservation planning. Poor soil forests are absent from the Peruvian protected-area system with the exception of the small Allpahuayo-Mishana preserve in northern Peru, which protects extreme white-sand patches of Quaternary origin. The majority of large protected areas in Peru are instead located in southern Peru, and protect rich-soil forests in the Manu, Tambopata, or Alto Purus parks. Due to their unique flora and underrepresentation in existing protected

areas, poor-soil forests on Late Miocene-Pleistocene sediments should be a conservation priority for the state of Peru.

The recently-proposed Pucacuro protected area is the best candidate for protecting these poor soils, but its current configuration is not suitable for this purpose. This reserve encompasses the watershed of the Pucacuro river, and is thus divided evenly between the rich soils of the Pebas formation in its headwaters, in our study area, and a narrow avenue of Nauta Formation poor soils along its lower reaches. We recommend that this protected area be delineated so as to include a large portion of the watershed of the Rio Nanay, and thus include large expanses of undisturbed Late Miocene-Pleistocene soils represented there by the Nauta Formation.

We last recommend a survey effort throughout the northern Peruvian Amazon with the objective of mapping potential poor-soil islands and verifying them with ground data. The novel combination of Landsat and SRTM data demonstrated here solves a longstanding lack of floristic and geological data for these forests, and can be used across western Amazonia to rapidly identify, verify, and map the location of these islands. These maps can then be used to produce effective and compelling strategies for the protection of the full range of the western Amazonian biota.

**Table 14: Results of indicator species analysis for Pteridophyte species**

<b>Species</b>	<b>IV<sup>1</sup></b>	<b>Group<sup>2</sup></b>	<b>P<sup>3</sup></b>
<i>Adiantum cayanense</i>	25	Nauta	**
<i>Adiantum fuliginosum</i>	63.02	Nauta	**
<i>Adiantum tomentosum</i>	70.42	Nauta	**
<i>Asplenium juglandifolium</i>	20.45	Nauta	NS
<i>Cyclodium meniscioides</i>	42.11	Nauta	NS
<i>Danaea lepreurii</i>	32.89	Nauta	NS
<i>Elaphoglossum luridum</i>	36.42	Nauta	NS
<i>Lindsea guianense</i>	68.75	Nauta	**
<i>Lindsea</i> sp. 1	70.42	Nauta	**
<i>Metaxya rostrata</i>	34.03	Nauta	**
<i>Nephrolepis</i> sp. 1	39.52	Nauta	NS
<i>Polybotrya pubens</i>	34.07	Nauta	NS
<i>Selaginella</i> sp. 3	34.03	Nauta	**
<i>Trichomanes elegans</i>	54.02	Nauta	**
<i>Triplophyllum</i> sp. 1	55.17	Nauta	**
<i>Adiantum humile</i>	89.55	Pebas	**
<i>Adiantum obliquum</i>	49	Pebas	**
<i>Adiantum pulvulentum</i> or <i>terminatum</i>	53.12	Pebas	NS
<i>Anetium citrifolium</i>	61.11	Pebas	**
<i>Asplenium auritum</i>	22.22	Pebas	**
<i>Asplenium cirrhatum</i>	36.11	Pebas	**
<i>Asplenium pearceii</i>	33.33	Pebas	**
<i>Asplenium</i> sp. 1	53.65	Pebas	NS
<i>Bolbitis lindigii</i>	47.22	Pebas	**
<i>Campyloneurum fuscusquamatum</i> or <i>phyllitides</i>	67.06	Pebas	**
<i>Cnemidia speciosa</i>	25.85	Pebas	NS
<i>Cyathea amazonicum</i> or sp. 1 or <i>lasiosora</i>	63.02	Pebas	NS
<i>Cyathea cuspidata</i>	75	Pebas	**
<i>Cyathea pungens</i>	45	Pebas	**
<i>Danae</i> sp. 1	16.16	Pebas	NS
<i>Danaea nodosa</i>	77.78	Pebas	**
<i>Didymochlaena trunculata</i>	17.01	Pebas	NS
<i>Dipazium grandifolium</i>	77.78	Pebas	**
<i>Diplazium</i> sp. 1	25	Pebas	NS
<i>Elaphoglossum flaccidum</i>	52.16	Pebas	NS
<i>Elaphoglossum raywaense</i>	52.48	Pebas	**
<i>Lindsea digitata</i>	18.75	Pebas	NS
<i>Lindsea phassa</i>	50	Pebas	**
<i>Lomagramma guianensis</i>	66.77	Pebas	**
<i>Lomariopsis japurensis</i>	76.88	Pebas	**
<i>Lomariopsis latifolia</i>	39.06	Pebas	**

Lomariopsis nigropaleata	49.49	Pebas	NS
Microgramma fuscusquamatum	75.76	Pebas	**
Polybotrya caudata or Cyclodium trianae	22.22	Pebas	**
Polybotrya crassirhizoma	72.32	Pebas	**
Polybotrya osmundaceae	79.13	Pebas	**
Polypodium sp. 2	36	Pebas	NS
Polypodium sp. 4	22.22	Pebas	**
Polypodium sp. 5	44.6	Pebas	**
Polytaenium cayenense	51.61	Pebas	NS
Saccoloma inaequale	54.35	Pebas	NS
Salpichlaena volubulis	49	Pebas	**
Selaginella exaltata	61.11	Pebas	**
Tectaria brauniana or sp.1	73.53	Pebas	**
Thelypteris sp. 4	51.04	Pebas	**
Thelypteris sp. 7	25	Pebas	**
Trichomanes diversifrons	73.53	Pebas	**
Trichomanes pinnatum	51.91	Pebas	NS

<sup>1</sup>Indicator value

<sup>2</sup>Geologically-defined group with which species was best associated

<sup>3</sup>P-value of association; NS indicates "not significant", \*\* indicates  $P \leq 0.05$

**Table 15: Soil properties for 52 sites in northwestern Amazonia**

Tr. #	pH	LOI	P <sup>1</sup>	Al <sup>1</sup>	Ca <sup>1</sup>	K <sup>1</sup>	Mg <sup>1</sup>	Na <sup>1</sup>	Sum cations <sup>2</sup>	Percent clay <sup>3</sup>	Percent silt <sup>3</sup>	Percent sand <sup>3</sup>
1	3.53	10.10	1.25	6.48	0.35	0.11	0.15	0.05	0.67	63.00	23.10	13.90
2	3.40	10.90	1.10	9.08	0.23	0.12	0.16	0.04	0.55	61.00	31.40	7.60
3	3.46	9.14	1.26	10.96	0.44	0.19	0.48	0.05	1.16	44.10	50.50	5.40
4	3.40	12.80	1.55	8.09	0.25	0.15	0.20	0.04	0.64	70.30	22.10	7.60
5	3.60	7.63	2.25	8.01	0.26	0.20	0.30	0.04	0.80	34.40	44.60	21.00
6	3.47	9.33	3.27	10.36	0.54	0.19	0.41	0.05	1.19	40.10	46.80	13.10
7	3.45	9.49	2.79	10.66	0.38	0.26	0.42	0.04	1.10	40.10	47.00	12.90
8	5.15	12.80	10.08	0.01	17.66	0.36	3.19	0.05	21.26	25.40	59.80	14.80
9	3.48	10.36	3.34	10.64	0.47	0.23	0.44	0.04	1.18	41.70	48.40	9.90
10	3.49	7.21	4.19	6.83	0.26	0.12	0.20	0.04	0.62	25.30	45.40	29.30
11	3.93	9.40	2.70	1.77	9.49	0.38	3.78	0.05	13.70	32.70	50.30	17.00
12	4.03	10.46	4.33	1.40	7.94	0.32	2.30	0.05	10.62	45.40	41.10	13.50
13	3.80	8.56	2.75	2.54	2.33	0.17	1.40	0.04	3.93	40.50	37.10	22.40
14	3.71	8.24	2.62	3.60	3.73	0.20	1.39	0.04	5.36	32.40	43.60	24.00
15	3.47	12.52	4.54	6.92	0.68	0.16	0.47	0.03	1.34	58.30	27.90	13.80
16	3.83	7.07	2.68	2.12	4.91	0.22	2.11	0.05	7.28	28.00	51.40	20.60
17	3.49	8.63	2.45	4.85	0.22	0.11	0.17	0.03	0.52	50.40	26.00	23.60
18	3.66	8.32	3.70	3.75	1.75	0.17	0.81	0.04	2.76	40.20	39.10	20.70
19	3.41	14.95	3.12	7.01	0.22	0.13	0.15	0.03	0.53	76.60	13.40	10.00
20	3.69	6.07	4.57	4.05	1.35	0.16	0.68	0.05	2.24	26.90	45.80	27.30
21	3.34	7.29	3.06	7.61	0.28	0.13	0.17	0.05	0.63	30.40	52.90	16.70
22	3.46	5.61	2.93	4.15	0.18	0.07	0.09	0.03	0.36	14.30	50.50	35.20
23	3.55	8.16	2.53	8.18	1.35	0.19	0.57	0.04	2.14	33.30	53.00	13.70
24	3.41	9.18	2.83	11.25	0.78	0.20	0.35	0.06	1.40	35.30	57.50	7.20
25	3.65	7.07	2.77	5.69	2.19	0.19	0.88	0.03	3.29	28.60	60.30	11.10
26	4.09	9.37	2.99	0.63	10.91	0.36	2.39	0.05	13.70	35.60	52.40	12.00
27	3.49	7.04	2.83	6.72	1.57	0.19	0.71	0.04	2.51	26.80	54.90	18.30
28	3.36	8.83	3.43	10.16	0.68	0.19	0.39	0.02	1.28	34.90	48.80	16.30
29	3.68	7.52	2.50	5.54	4.02	0.23	2.02	0.03	6.31	31.80	51.30	16.90
30	3.55	7.27	2.23	8.96	0.46	0.16	0.43	0.04	1.08	32.90	54.60	12.50
31	3.76	8.42	2.53	3.24	6.53	0.25	1.71	0.03	8.51	33.10	59.30	7.60
32	3.89	11.25	4.13	2.69	5.11	0.20	1.27	0.04	6.61	45.10	39.00	15.90
33	3.43	7.10	3.34	6.83	0.70	0.16	0.35	0.05	1.26	23.70	57.20	19.10
34	3.49	8.94	3.12	10.81	1.01	0.19	0.48	0.04	1.72	31.30	57.40	11.30
35	3.34	12.34	1.75	7.55	0.26	0.12	0.15	0.03	0.55	59.40	26.10	14.50
36	3.98	8.38	1.81	1.46	10.37	0.32	2.57	0.07	13.34	37.80	54.00	8.20
37	3.52	6.43	1.53	6.92	0.22	0.10	0.14	0.03	0.49	25.40	44.10	30.50
38	3.52	13.54	0.98	6.88	0.29	0.11	0.15	0.03	0.59	20.10	74.90	5.00
39	3.59	8.84	0.56	6.03	0.26	0.08	0.12	0.02	0.48	61.50	23.70	14.80
40	3.48	8.29	1.09	9.79	3.26	0.25	1.47	0.06	5.04	32.50	60.80	6.70
41	3.42	13.85	1.17	5.85	0.30	0.11	0.15	0.04	0.60	67.50	21.50	11.00

42	3.50	7.31	0.29	12.46	0.96	0.20	0.54	0.06	1.75	34.10	61.10	4.80
43	3.51	8.32	0.49	7.31	0.28	0.10	0.13	0.02	0.54	35.60	49.80	14.60
44	3.47	11.73	1.92	6.17	0.35	0.16	0.20	0.02	0.74	63.50	23.20	13.30
45	3.56	11.30	1.54	4.94	0.37	0.13	0.17	0.03	0.70	77.40	13.50	9.10
46	3.46	12.22	2.14	5.85	0.28	0.17	0.21	0.03	0.68	66.90	17.00	16.10
47	3.47	15.72	1.60	6.00	0.27	0.13	0.18	0.05	0.62	75.80	12.90	11.30
48	3.53	13.52	1.20	5.14	0.19	0.09	0.13	0.03	0.45	74.60	14.60	10.80
49	3.57	7.16	1.01	9.01	1.23	0.16	0.79	0.03	2.21	36.70	53.80	9.50
50	3.64	7.19	2.57	9.34	0.60	0.19	0.84	0.05	1.68	32.90	53.20	13.90
51	3.77	6.31	1.80	3.88	1.81	0.14	0.58	0.04	2.57	25.87	35.73	38.40
52	3.45	12.76	1.93	6.74	0.25	0.13	0.24	0.04	0.66	60.77	24.50	14.73

<sup>1</sup>cmol[+]/kg

<sup>2</sup>Ca+Mg+Na+K

<sup>3</sup>Clay defined as <0.002mm diameter; silt defined as 0.002-0.063mm; sand defined as >0.063

**Table 16: Correlations between floristic composition and environmental variables**

<b>Environmental variable<sup>1</sup></b>	<b>Axis I</b>	<b>Axis II</b>	<b>Squared Mantel r</b>
pH	0.34	(0.02)	0.08
LOI	0.24	(0.11)	0.10
Log P	0.20	(0.01)	0.02
Log Al	0.19	(0.08)	0.06
LogCa	0.70	(0.06)	0.27
Log Mg	0.78	(0.10)	0.40
Log Na	0.18	(0.06)	0.02
Log K	0.52	0.16	0.16
Percent clay	0.36	(0.09)	0.19
Percent silt	0.33	0.20	0.17
Percent sand	(0.03)	(0.07)	(0.00)
Log sum of cations	0.72	(0.07)	0.31
Elevation	0.36	(0.09)	0.11

<sup>1</sup>"Log" indicates base-10 logarithm transformation  
 All values significant at  $P \leq 0.01$ , with exception of values in parentheses

Table 17: Pairwise correlations between environmental variables<sup>1</sup>

	LOI	Log P	Log Al	Log Ca	Log K	Log Mg	Log Na	Log sum of cations	% Clay	% Silt	% Sand	Elev.
pH	0.00	<b>0.41</b>	<b>-0.95</b>	<b>0.75</b>	<b>0.58</b>	<b>0.68</b>	0.32	<b>0.75</b>	-0.27	0.26	0.09	-0.12
LOI		-0.04	-0.13	-0.24	-0.11	-0.28	-0.14	-0.24	<b>0.76</b>	<b>-0.60</b>	<b>-0.49</b>	<b>0.60</b>
Log P			<b>-0.45</b>	<b>0.38</b>	<b>0.42</b>	<b>0.40</b>	0.17	<b>0.40</b>	-0.26	0.12	0.33	<b>-0.36</b>
Log Al				<b>-0.64</b>	<b>-0.44</b>	<b>-0.53</b>	-0.23	<b>-0.63</b>	0.16	-0.11	-0.14	-0.02
Log Ca					<b>0.82</b>	<b>0.96</b>	<b>0.44</b>	<b>0.99</b>	<b>-0.42</b>	<b>0.47</b>	-0.02	-0.27
Log K						<b>0.89</b>	<b>0.54</b>	<b>0.86</b>	-0.31	<b>0.47</b>	-0.27	<b>-0.44</b>
Log Mg							<b>0.48</b>	<b>0.98</b>	<b>-0.44</b>	<b>0.50</b>	-0.05	<b>-0.42</b>
Log Na								<b>0.47</b>	-0.26	<b>0.37</b>	-0.17	<b>-0.48</b>
Log sum of cations									<b>-0.42</b>	<b>0.48</b>	-0.04	-0.33
% Clay										<b>-0.90</b>	-0.39	<b>0.62</b>
% Silt											-0.06	<b>-0.57</b>
% Sand												-0.22

<sup>1</sup>Values for cations (P, Al, Ca, K, Mg, and Na) represent base-10 transformed concentrations (cmol[+]/kg)

Values in bold are significant at  $P \leq 0.01$



Table 18: Comparison of observed and predicted floristic classes

Transect	Clustering group <sup>1</sup>	Classification using CART threshold <sup>2</sup>		
		Elevation <sup>3</sup>	Log sum of cations <sup>4</sup>	% Clay <sup>5</sup>
1	Nauta	Nauta	Nauta	Nauta
2	Nauta	<b>Pebas</b>	Nauta	Nauta
4	Nauta	Nauta	Nauta	Nauta
19	Nauta	Nauta	Nauta	Nauta
21	Nauta	<b>Pebas</b>	Nauta	<b>Pebas</b>
22	Nauta	<b>Pebas</b>	Nauta	<b>Pebas</b>
35	Nauta	Nauta	Nauta	Nauta
37	Nauta	Nauta	Nauta	<b>Pebas</b>
38	Nauta	Nauta	Nauta	<b>Pebas</b>
39	Nauta	Nauta	Nauta	Nauta
41	Nauta	Nauta	Nauta	Nauta
44	Nauta	Nauta	Nauta	Nauta
45	Nauta	Nauta	Nauta	Nauta
46	Nauta	Nauta	Nauta	Nauta
47	Nauta	Nauta	Nauta	Nauta
52	Nauta	Nauta	Nauta	Nauta
3	Pebas	Pebas	Pebas	Pebas
5	Pebas	Pebas	<b>Nauta</b>	Pebas
6	Pebas	Pebas	Pebas	Pebas
7	Pebas	Pebas	Pebas	Pebas
8	Pebas	Pebas	Pebas	Pebas
9	Pebas	Pebas	Pebas	Pebas
10	Pebas	Pebas	<b>Nauta</b>	Pebas
11	Pebas	Pebas	Pebas	Pebas
12	Pebas	Pebas	Pebas	Pebas
13	Pebas	Pebas	Pebas	Pebas
14	Pebas	Pebas	Pebas	Pebas
15	Pebas	Pebas	Pebas	Pebas
16	Pebas	Pebas	Pebas	Pebas
17	Pebas	Pebas	<b>Nauta</b>	Pebas
18	Pebas	Pebas	Pebas	Pebas
20	Pebas	Pebas	Pebas	Pebas
23	Pebas	Pebas	Pebas	Pebas
24	Pebas	Pebas	Pebas	Pebas
25	Pebas	Pebas	Pebas	Pebas
26	Pebas	Pebas	Pebas	Pebas
27	Pebas	Pebas	Pebas	Pebas

28	Pebas	Pebas	Pebas	Pebas
29	Pebas	Pebas	Pebas	Pebas
30	Pebas	Pebas	Pebas	Pebas
31	Pebas	Pebas	Pebas	Pebas
32	Pebas	<b>Nauta</b>	Pebas	Pebas
33	Pebas	Pebas	Pebas	Pebas
34	Pebas	Pebas	Pebas	Pebas
36	Pebas	Pebas	Pebas	Pebas
40	Pebas	Pebas	Pebas	Pebas
42	Pebas	Pebas	Pebas	Pebas
43	Pebas	<b>Nauta</b>	<b>Nauta</b>	Pebas
48	Pebas	<b>Nauta</b>	<b>Nauta</b>	<b>Nauta</b>
49	Pebas	Pebas	Pebas	Pebas
50	Pebas	Pebas	Pebas	Pebas
51	Pebas	Pebas	Pebas	Pebas

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<sup>1</sup>Clustering group, named by geological formation with which it is associated

<sup>2</sup>Classification of sites based on elevation, cation concentrations, or clay content

<sup>3</sup>Sites classified by elevation; "Nauta" indicates elevation  $\geq 251.105$  m, "Pebas" indicates elevation  $< 251.103$  m

<sup>4</sup>Sites classified by base-10 logarithm transformation of sum of concentrations of Ca, Mg, K, and Na; "Nauta" indicates  $< -0.0971724$ , "Pebas" indicates  $\geq -0.0971724$

<sup>5</sup>Sites classified by clay content; "Nauta" indicates percent clay  $\geq 59.4$ , "Pebas" indicates percent clay  $< 59.4$

Boldface indicates error in classification relative to clustering group

Table sorted by clustering group, and then by transect number

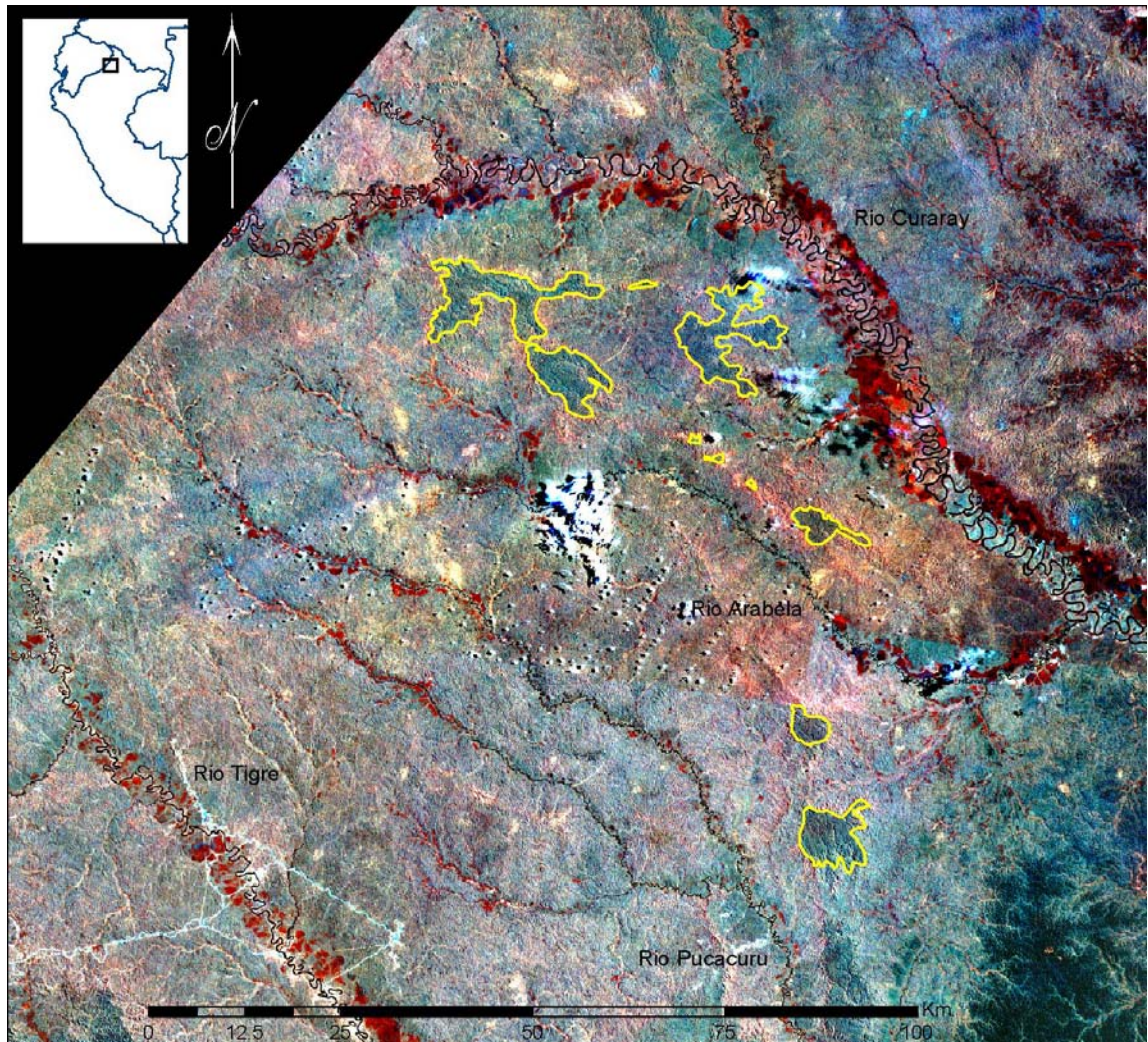
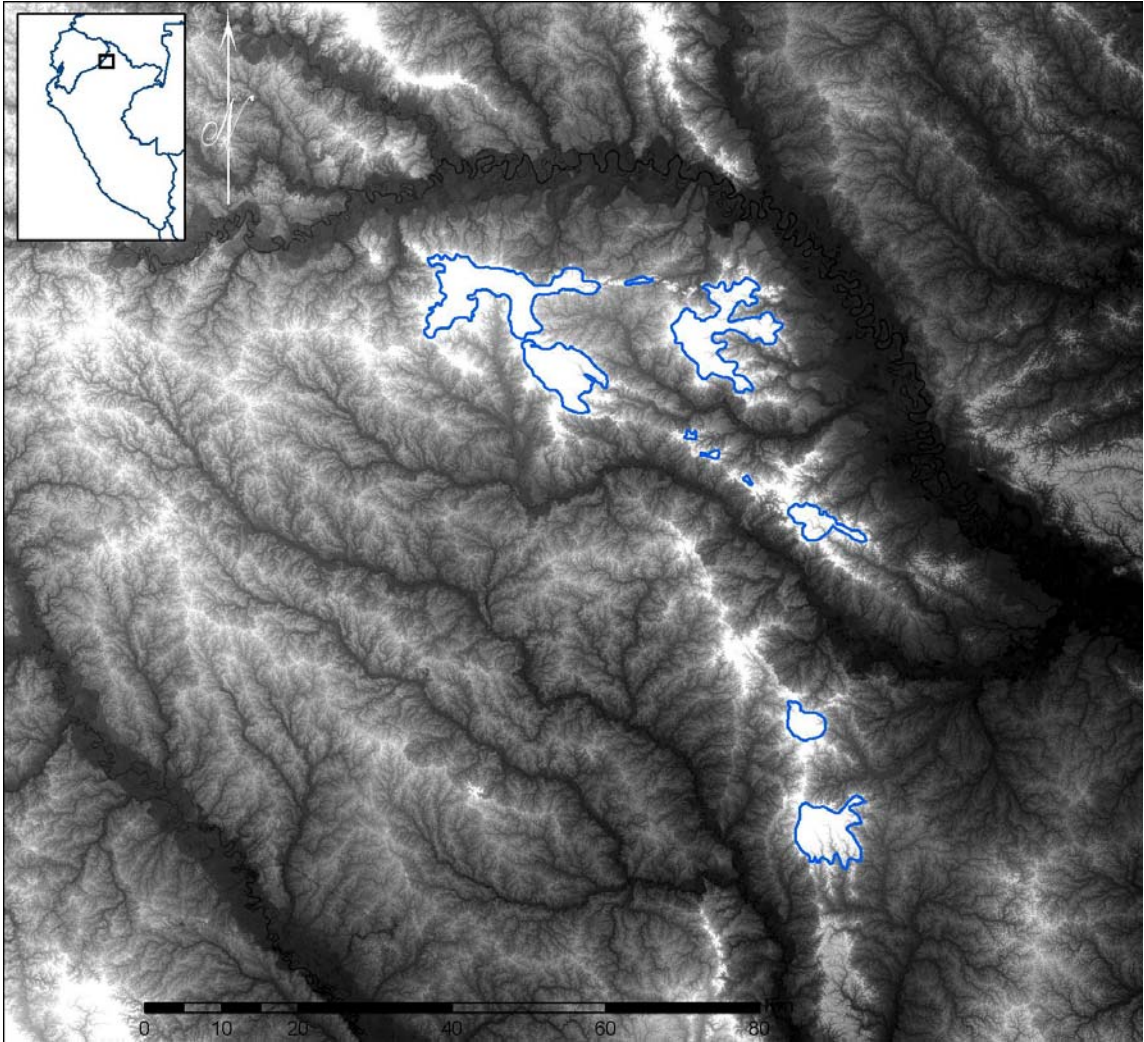
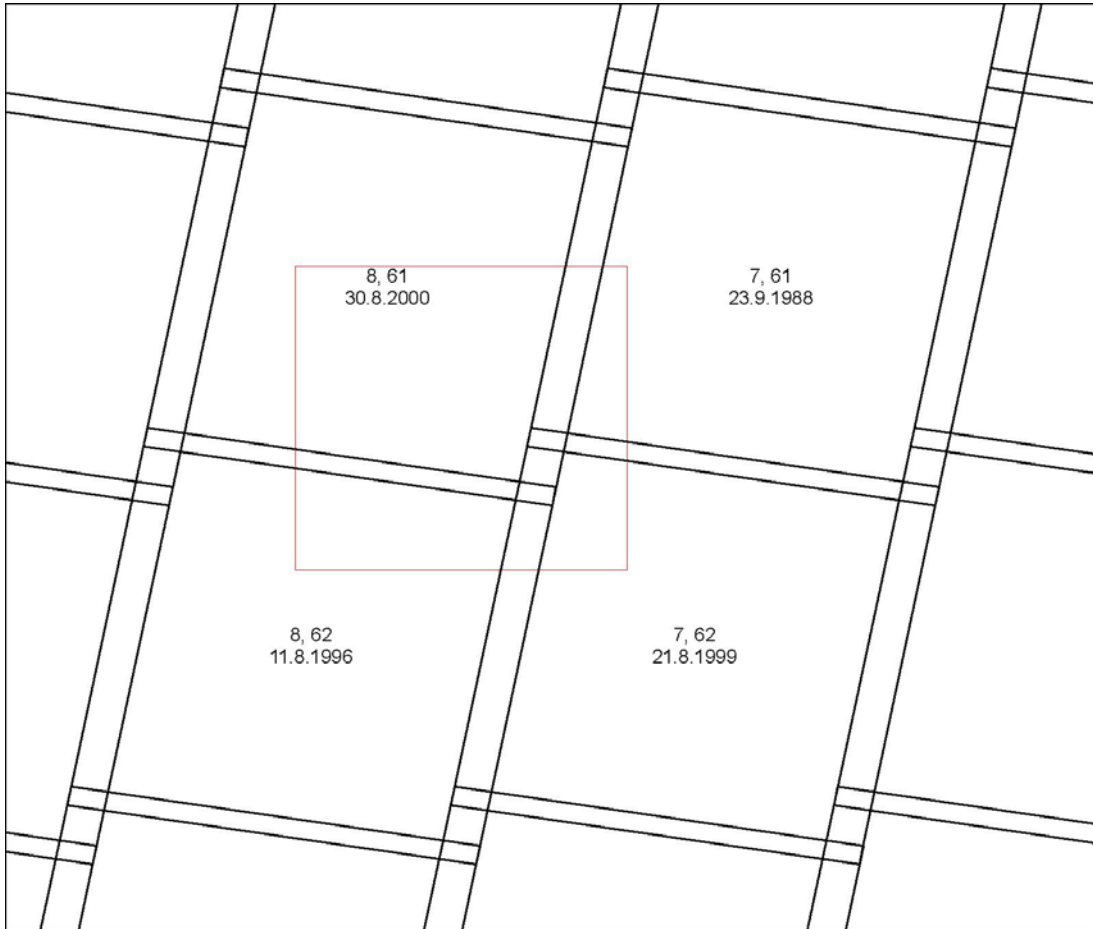


Figure 11: Landsat mosaic and interpretation for study area. Mosaic consists of four overlapping images (see Figure 13) comprised of bands 4, 5, and 7, set to display in red, green, and blue, respectively. Image interpretation is overlaid in yellow. Red tones along rivers indicate swamp forests and white area in center of image represents clouds.

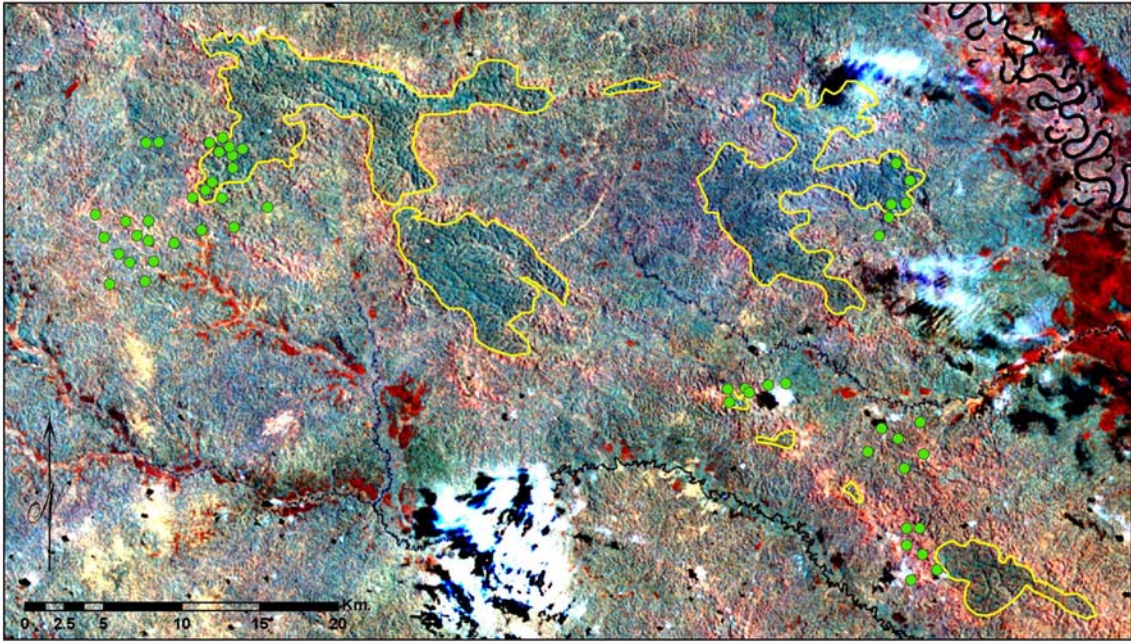


**Figure 12: SRTM data for study area. Light tones indicate high elevations and dark tones low elevations. Image interpretation is overlaid in blue. Elevation ranges from 120 to 320 meters.**

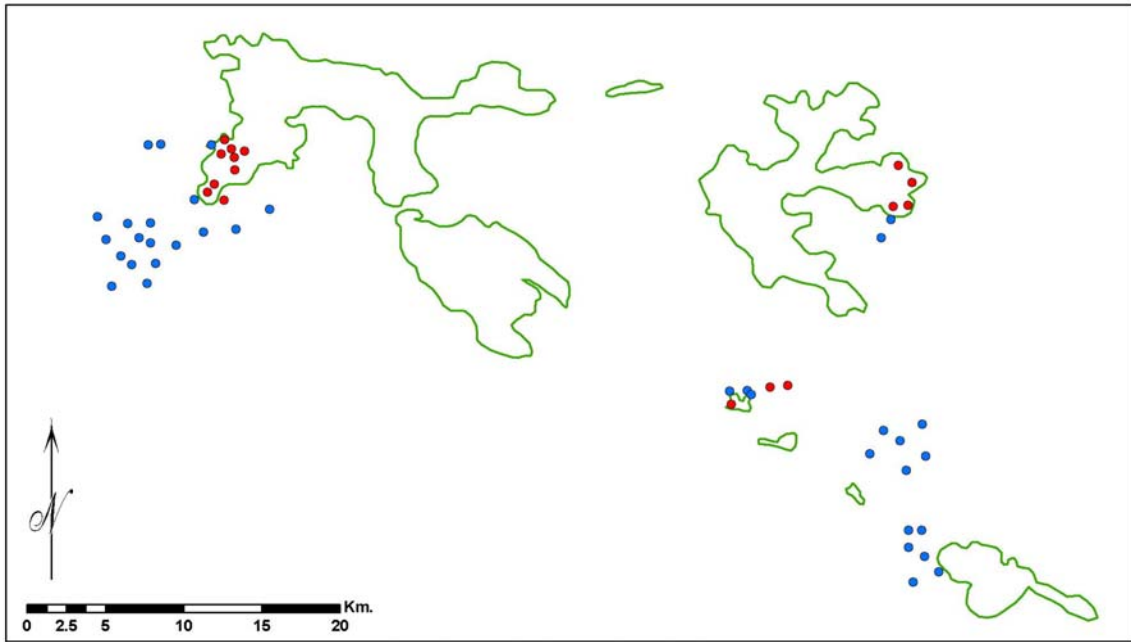




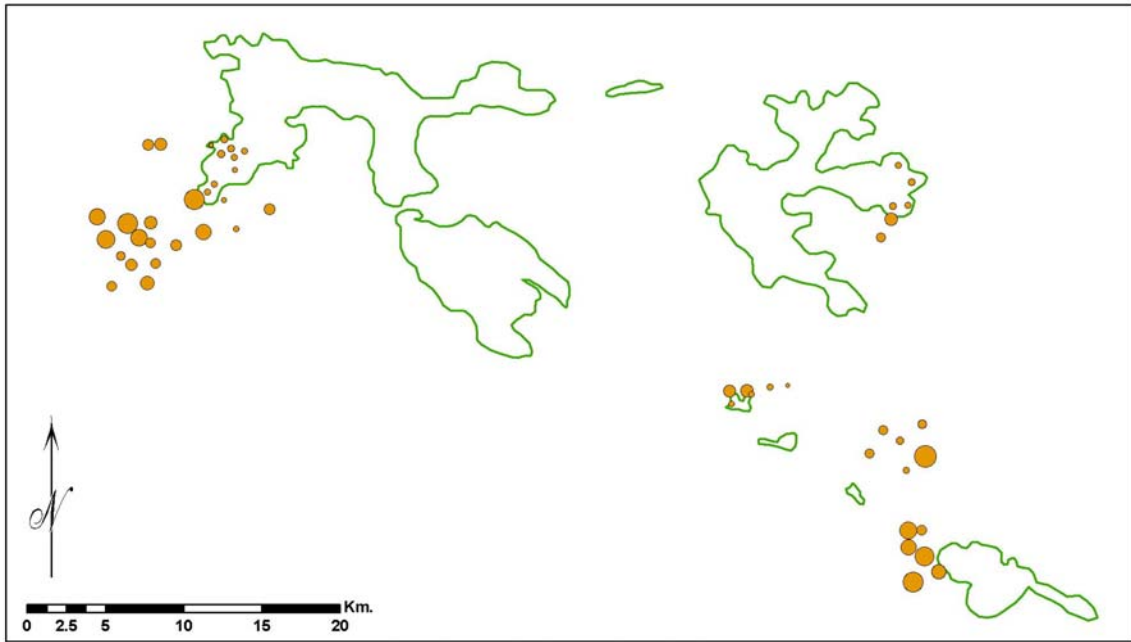
**Figure 13: Landsat images used to construct Landsat mosaic. Black lines indicate image outlines and red box indicates extent of mosaic. Upper value for each image indicates path and row of image, and bottom value indicates the image date.**



**Figure 14: Location of plant inventories. Green points represent 52 fern inventories established during 2008. Yellow lines indicate boundaries between poor-soil islands and rich-soil matrix. Landsat mosaic consists of bands 4, 5, and 7, set to red, green, and blue**

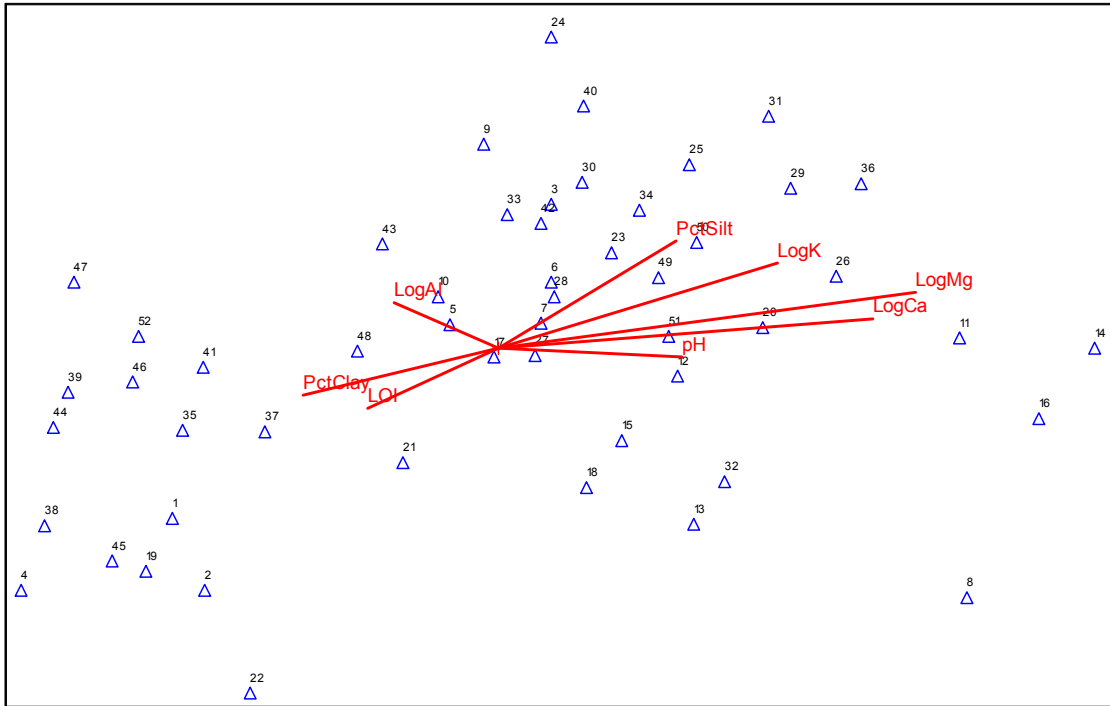


**Figure 15: Results of clustering analysis for fern inventories. Red and blue points indicate fern inventories, classified into two groups. Green lines indicate boundaries between poor-soil islands and rich-soil matrix. Map location and scale as in Figure 14.**

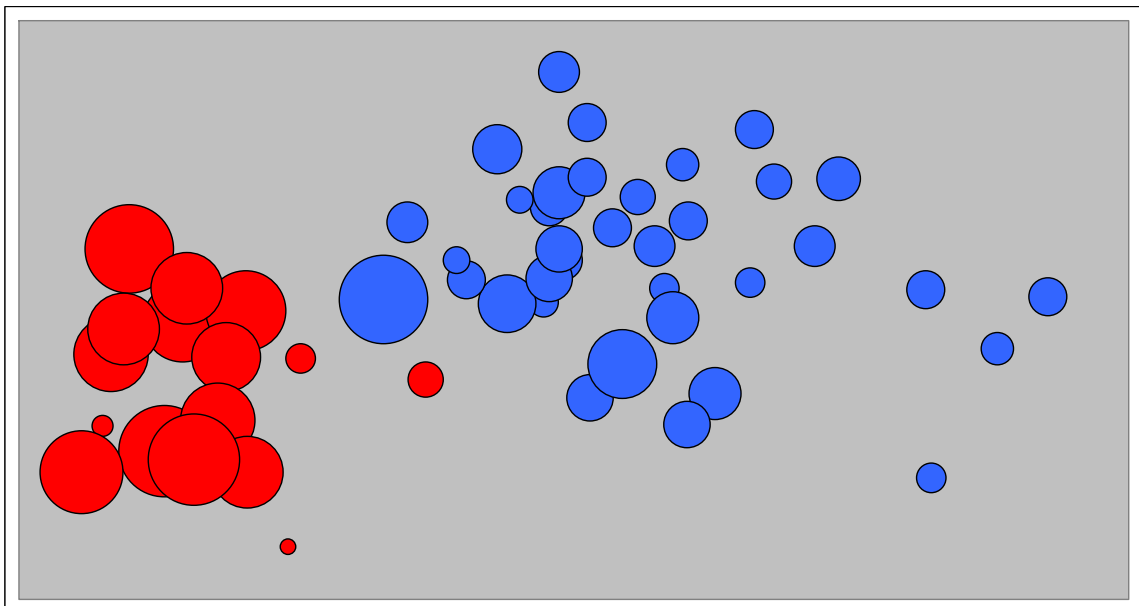
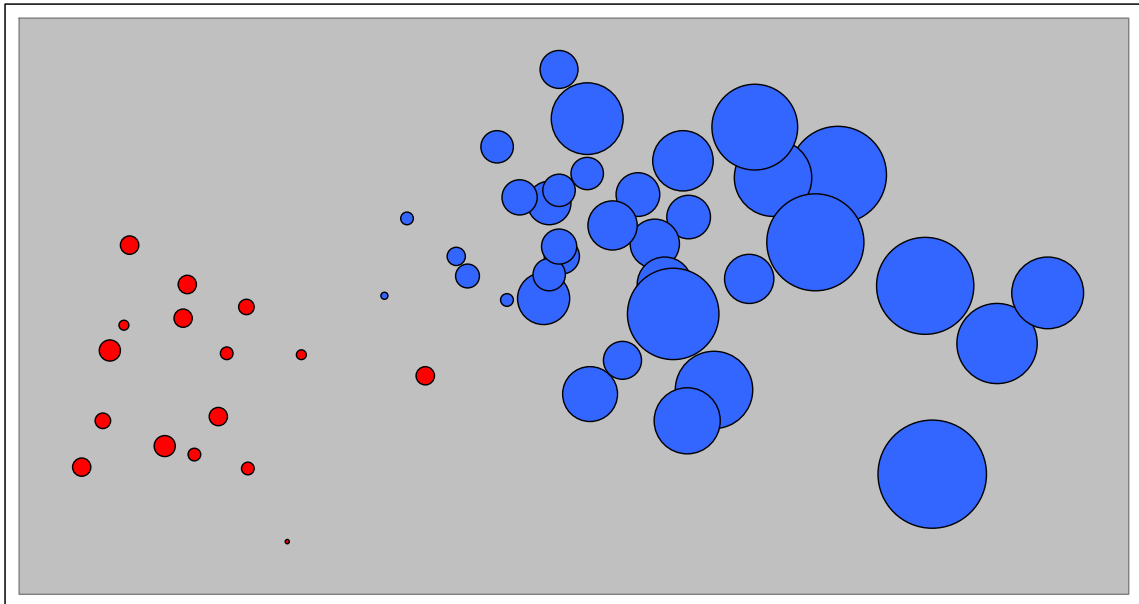


**Figure 16: Cation availability at inventory sites. Circles indicate inventory sites, and diameter of circles indicates cation availability, measured as the log-transformed sum of Mg, Ca, Na, and K concentrations. Green lines indicate boundaries between poor-soil islands and rich-soil matrix. Map location and scale as in Figure 14.**

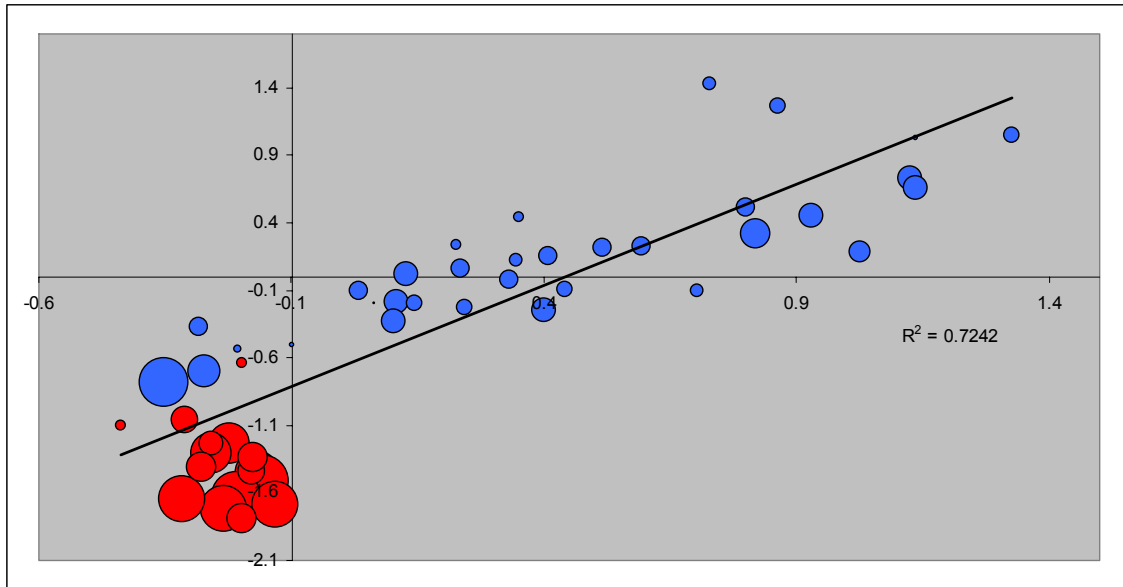




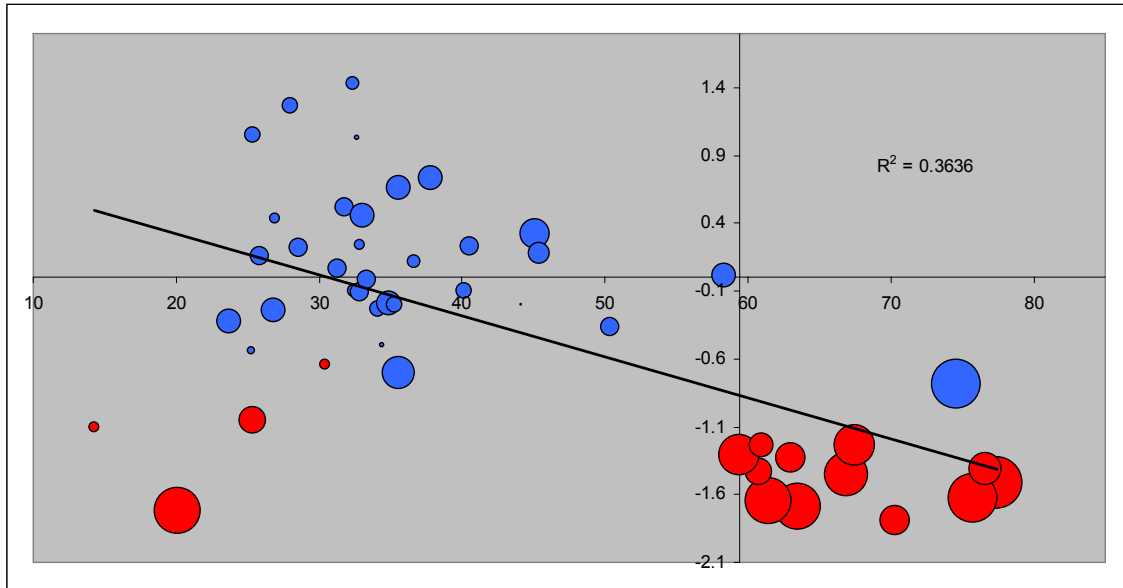
**Figure 17: NMDS ordination of floristic data and correlations with soil properties. Horizontal axis is axis I and vertical axis is axis II. Blue triangles indicate transects, and red vectors indicate strength of correlation of environmental variables with ordination axes. Vectors for Log Na and P are obscured behind Log K and pH, respectively.**



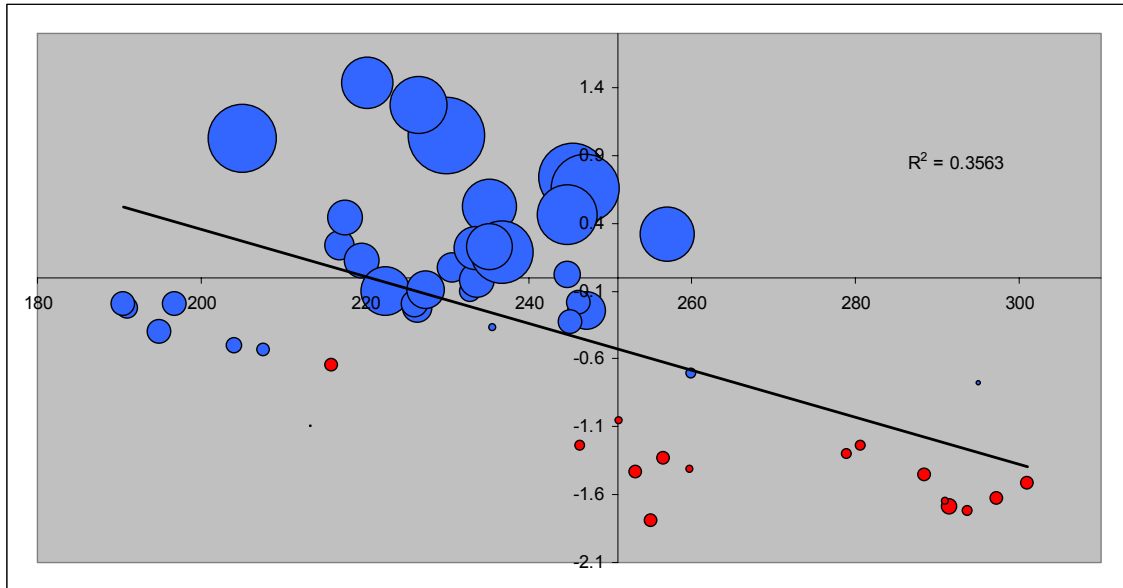
**Figure 18: Relationship between clustering groups, ordination axes, and two environmental variables. Horizontal axis is NMDS axis I and vertical axis is NMDS axis II. Color of points indicates clustering group (red for Nauta group, and blue for Pebas group) and diameter indicates (A, top) cation concentration (log-transformed sum of Mg, Ca, K, and Na), or (B, bottom) percent clay.**



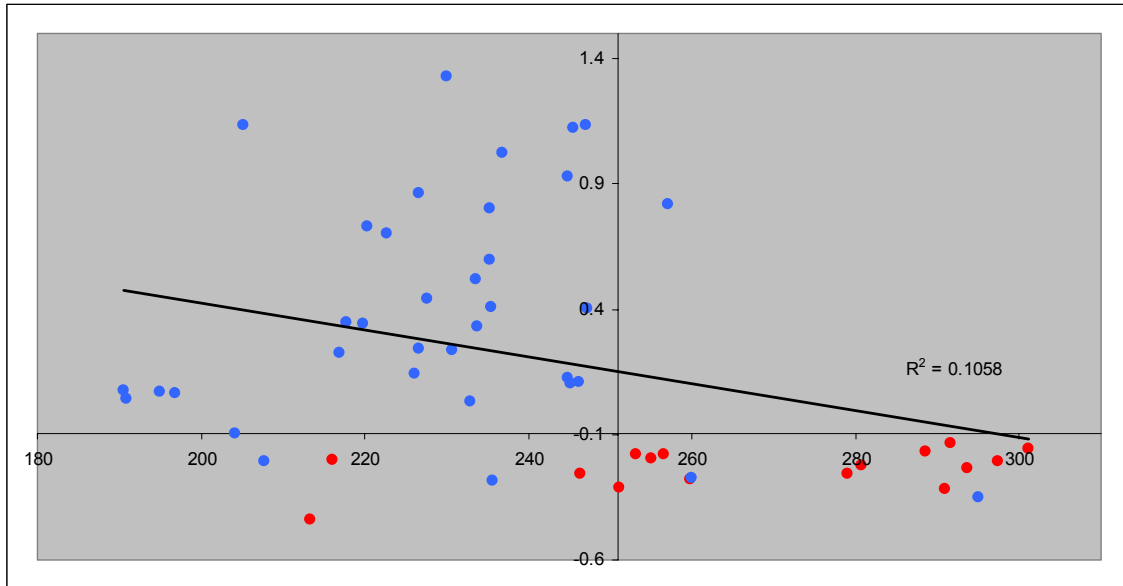
**Figure 19: Regression of cation concentrations on NMDS axis I. X-axis represents the log-transformed sum of cation concentrations (Mg, Ca, K, and Na), and Y-axis represents positions on NMDS axis I. Color of points indicates clustering group (red for Nauta group, and blue for Pebas group) and diameter indicates elevation. Y-axis crosses X-axis at cation threshold identified by CART analysis (-0.0971724).**



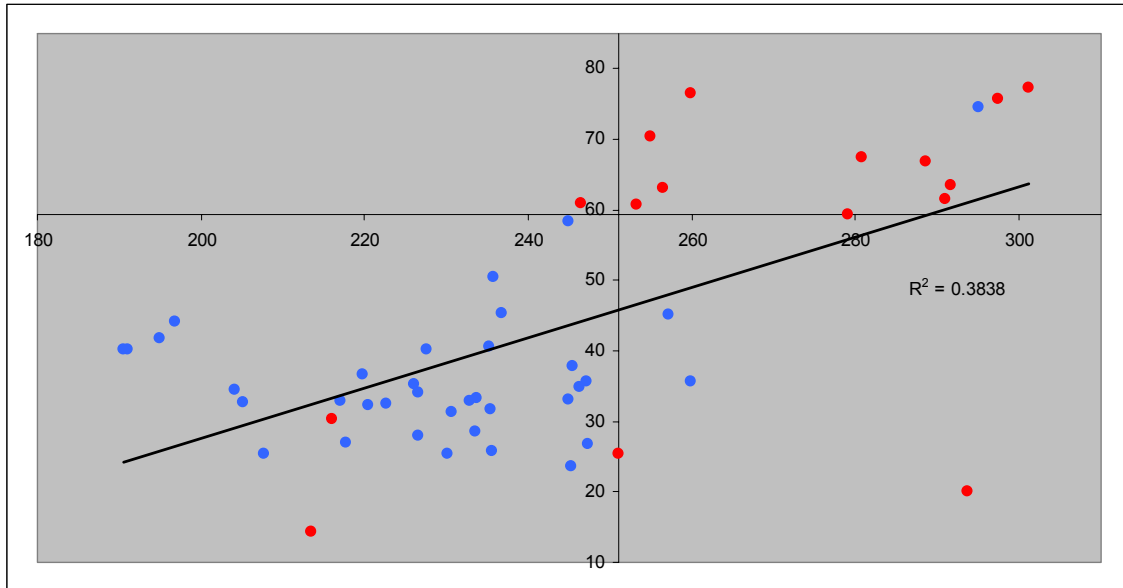
**Figure 20: Regression of clay content on NMDS axis I. X-axis represents percent clay, and Y-axis represents positions on NMDS axis I. Color of points indicates clustering group (red for Nauta group, and blue for Pebas group) and diameter indicates elevation. Y-axis crosses X-axis at percent clay threshold identified by CART analysis (59.4%).**



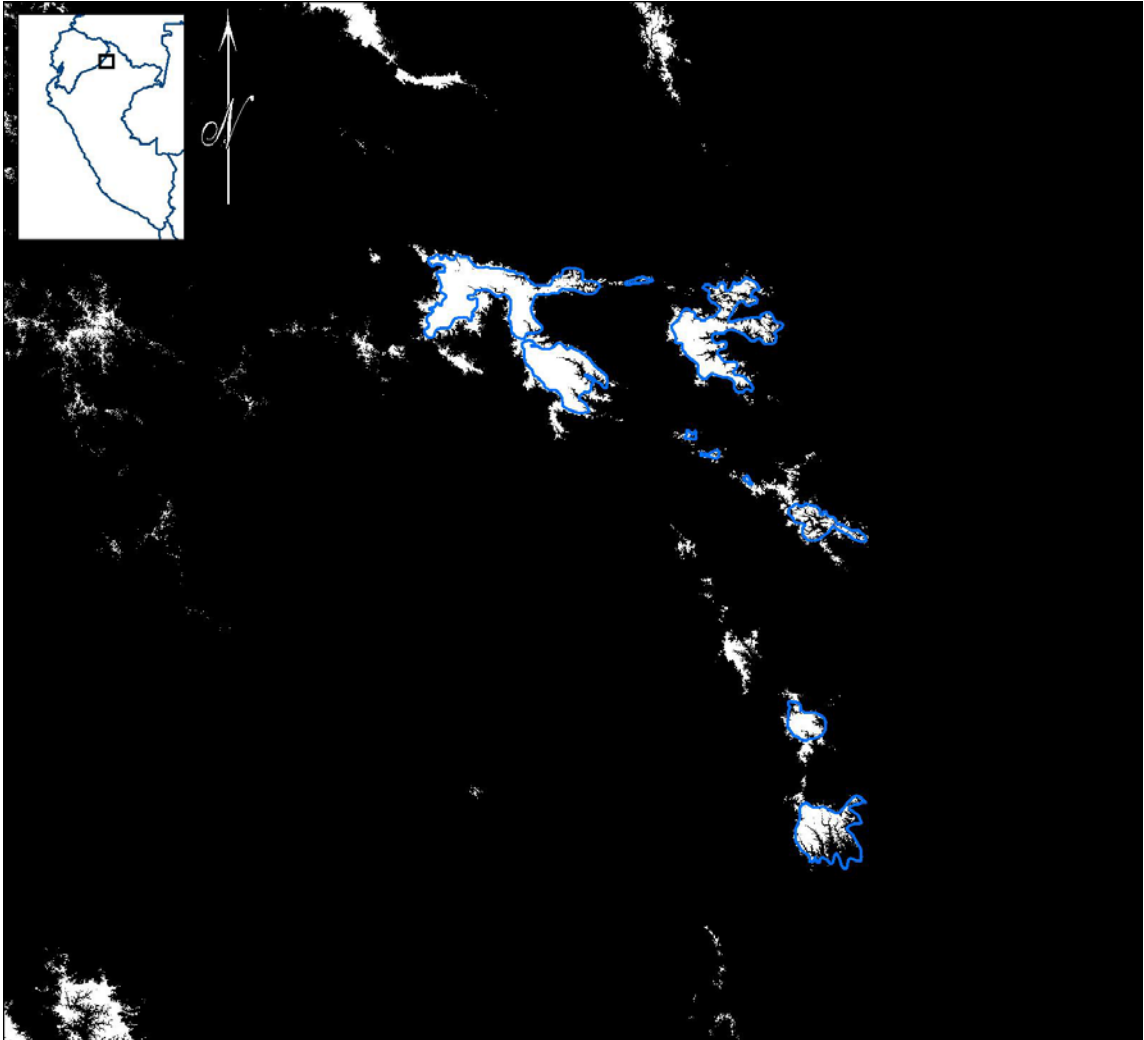
**Figure 21: Regression of elevation on NMDS axis I. X-axis represents elevation, and Y-axis represents positions on NMDS axis I. Color of points indicates clustering group (red for Nauta group, and blue for Pebas group) and diameter indicates cation concentration (log-transformed sum of Mg, Ca, K, and Na). Y-axis crosses X-axis at elevation threshold identified by CART analysis (251.103 m).**



**Figure 22: Regression of elevation on cation concentration. X-axis represents elevation, and Y-axis represents cation concentration (log-transformed sum of Mg, Ca, K, and Na). Color of points indicates clustering group (red for Nauta group, and blue for Pebas group). Y-axis crosses X-axis at elevation threshold identified by CART analysis (251.103 m), and X-axis crosses Y-axis at cation threshold (-0.0971724).**

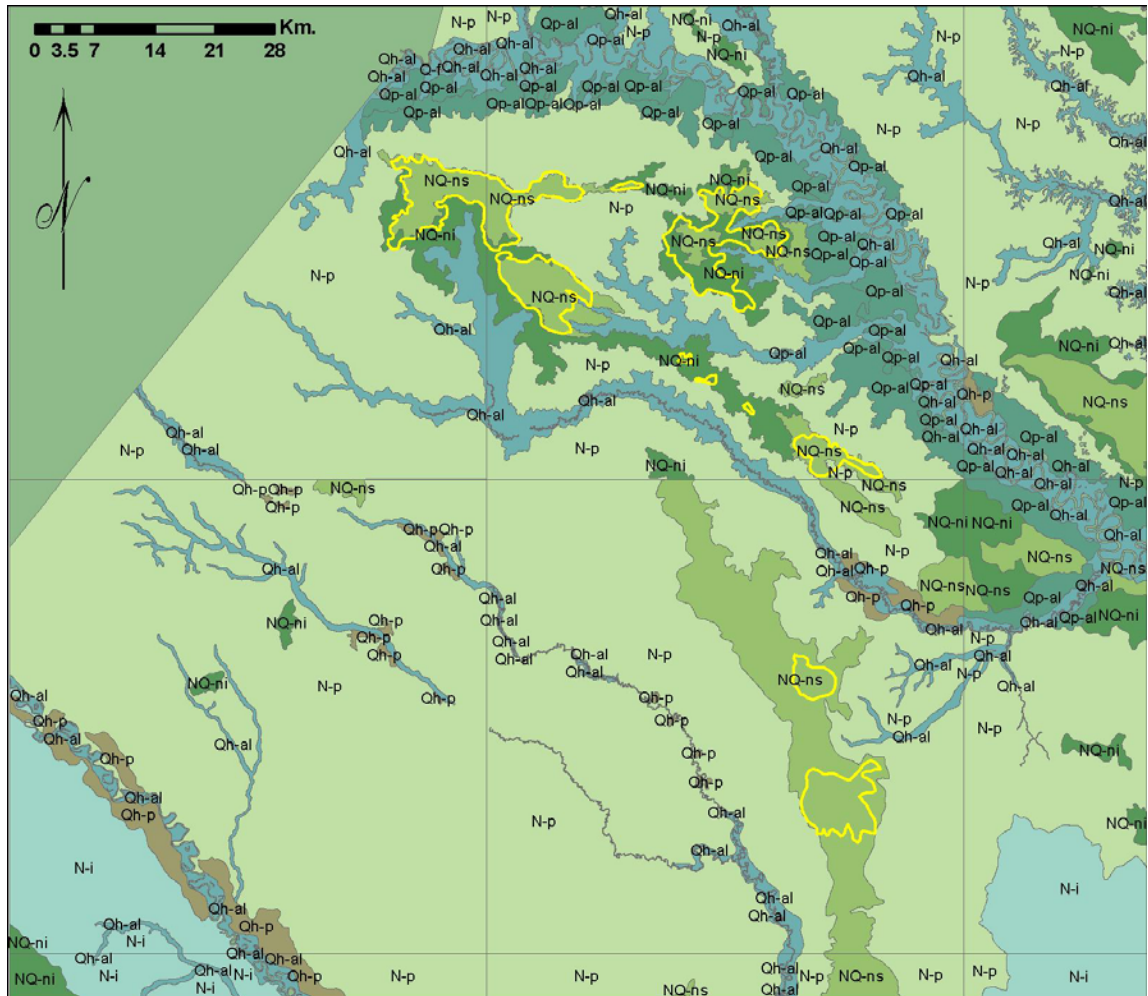


**Figure 23: Regression of elevation on clay content. X-axis represents elevation, and Y-axis represents percent clay. Color of points indicates clustering group (red for Nauta group, and blue for Pebas group). Y-axis crosses X-axis at elevation threshold identified by CART analysis (251.103 m), and X-axis crosses Y-axis at percent clay threshold (59.4%).**



**Figure 24: Classified SRTM for study area. Values of 1 (white) indicate areas classified by elevation as Nauta Formation forest (elevation greater than 251.103 m), and values of 0 (black) indicated areas classified as Pebas Formation forest (elevation less than 251.103 m). Image interpretation is overlaid in blue.**





**Figure 25: Relationship between floristic composition and regional geological patterns. Labeled patches represent geological formations and yellow lines indicate boundaries identified in this study. Geological formations are as follows: NQ-ns = Neogene to Quaternary, Nauta superior; NQ-ni = Neogene to Quaternary, Nauta inferior; N-p = Neogene, Pebas; Qp-al = Pleistocene alluvial deposition; Qh-al = Holocene alluvial deposition; N-i = Ipururo formation (INGEMMET 2000).**

## Chapter 6. Conclusion

This dissertation had three objectives: (1) to systematically evaluate methods for tropical forest inventory, and identify the most efficient solutions to this problem; (2) to use these methods, in combination with satellite imagery and soil sampling, to study the relationship between geological formations and vegetation patterns in Amazonian forests; and (3) to use these tools map vegetation patterns in these forests. A full explanation of these goals and summaries of my individual chapters can be found in the introductory chapter. Here I summarize my major findings and some of their implications.

My primary finding is that the lowland forests of western Amazonia are partitioned into discrete compositional units on the basis of geological formations and their edaphic properties. Remarkably, this partitioning is controlled by the Andean uplift, up to 1000 kilometers distant, which has driven deposition and erosion across western Amazonia since the Miocene. These findings indicate that floristic patterns in lowland Amazonia are ultimately driven by long-term sub-Andean tectonics resulting from the subduction of the oceanic Nazca Plate beneath the continental South American Plate. These findings emphasize the importance of integrating geological knowledge into ecological studies of Amazonian forests.

In addition, the combination of rapid inventory with satellite image interpretation proved to be a powerful tool for identifying floristic patterns and their determinants. Matched patterns in Landsat imagery and SRTM data provides a simple and low-cost means of identifying floristic patterns of geological origin over large areas of otherwise inaccessible forest. Rapid, taxa-based inventory, then provides a fast and cost-efficient means of testing these patterns. It should be noted that rapid, taxa-based inventory is not intended to be a substitute for traditional multi-taxa inventories, and maps based on these data should not be used as the sole basis for decision-making. On the contrary, rapid inventory is a means of quickly and efficiently testing patterns observed in satellite imagery. This information can then be used to target more costly and time-consuming multi-taxa inventories.

These findings may also have implications for the function and evolution of Amazonian forests. Soil properties and floristic composition are correlated with ecosystem properties such as wood density, productivity, and forest dynamics, suggesting that the geological and compositional units described here may also correspond to functional units (Malhi et al. 2004, Phillips et al. 2004, ter Steege et al. 2006). Moreover, the strong relationship between these geological units and plants species distributions, and the evolution of these units through geological time, could provide an engine for diversification in the otherwise uninterrupted forests of western

Amazonia. These hypotheses can be tested by geological and genetic sampling across boundaries identified by the methods described here.

The existence of compositionally and functionally-distinct regions in Amazonian forests suggests that protected-area and carbon-sequestration strategies be developed and implemented in a region-by-region manner. Fortunately, the methods described here could be applied across Amazonia to rapidly identify and map floristic patterns, and thus provide the data needed for conservation and carbon sequestration planning. I recommend a three-stage approach: first, inspection of large-area Landsat and SRTM mosaics to identify matching geological and floristic boundaries; second, use of taxon-based plant inventory, soil sampling, and geological study to verify these boundaries; and last, image interpretation to map these boundaries. Further sampling with additional plant or animal taxa could last be used to determine the broader utility of these divisions. The maps generated by this process would then be used to create more effective and compelling strategies for the management and protection of the world's most extensive tropical forests.

## References

- Aleixo, A., and D. F. Rossetti. 2007. Avian gene trees, landscape evolution, and geology: towards a modern synthesis of Amazonian historical biogeography? *Journal of Ornithology* **148**:S443-S453.
- Arbelaez, F., J. F. Duivenvoorden, and J. A. Maldonado-Ocampo. 2008. Geological differentiation explains diversity and composition of fish communities in upland streams in the southern Amazon of Colombia. *Journal of Tropical Ecology* **24**:505-515.
- Ayres, J. M., and T. H. Cluttonbrock. 1992. River Boundaries and Species Range Size in Amazonian Primates. *American Naturalist* **140**:531-537.
- Bates, J. M., S. J. Hackett, and J. Cracraft. 1998. Area-relationships in the Neotropical lowlands: an hypothesis based on raw distributions of Passerine birds. *Journal of Biogeography* **25**:783-793.
- Botschek, J., J. Ferraz, M. Jahnel, and A. Skowronek. 1996. Soil chemical properties of a toposequence under primary rain forest in the Itacoatiara vicinity (Amazonas, Brazil). *Geoderma* **72**:119-132.
- Cajander, A. K. 1926. The theory of forest types. *Acta Forestalia Fennica* **29**:1-108.
- Campbell, D. G., 1989. Quantitative inventory of tropical forests. Pages 524-533 in D. G. Campbell and H. D. Hammond, editors. *Floristic inventory of tropical countries: the status of plant systematics, collections, and vegetation, plus recommendations for the future*. The New York Botanical Garden, New York.
- Christensen, N. L., and R. K. Peet. 1984. Convergence During Secondary Forest Succession. *Journal of Ecology* **72**:25-36
- Condit, R., N. Pitman, E. G. Leigh, J. Chave, J. Terborgh, R. B. Foster, P. Nunez, S. Aguilar, R. Valencia, G. Villa, H. C. Muller-Landau, E. Losos, and S. P. Hubbell. 2002. Beta-diversity in tropical forest trees. *Science* **295**:666-669.
- Dinerstein, E., D. M. Olson, D. J. Graham, A. L. Webster, S. A. Primm, M. P. Bookbinder, and G. LeDec. 1995. *A Conservation Assessment of the Terrestrial Ecoregions of Latin America and the Caribbean*. The World Bank, Washington, D.C.
- Dufrene, M., and P. Legendre. 1997. Species assemblages and indicator species: The need for a flexible asymmetrical approach. *Ecological Monographs* **67**:345-366.

- Duivenvoorden, J. 1995. Tree species composition and rain forest-environment relationships in the middle Caquetá area, Colombia, NW Amazonia. *Vegetatio* **120**: 91-113.
- Duivenvoorden, J. F., Svenning, J.-C. & Wright, S. J. 2002. Beta diversity in tropical forests. *Science* **295**:636–637.
- Duque, A., Phillips, J. F., von Hillebrand, P., Posada, C. A., Prieto, A., Rudas, A., Suescún, M. and Stevenson, P. 2009. Distance Decay of Tree Species Similarity in Protected Areas on Terra Firme Forests in Colombian Amazonia. *Biotropica* **41**: 599-607.
- Duque, A., Sánchez, M., Cavelier, J. & Duivenvoorden, J. F. 2002. Different floristic patterns of woody understorey and canopy plants Colombian Amazonia. *Journal of Tropical Ecology* **18**:499–525.
- Duque, A. J., Duivenvoorden, J. F., Cavelier, J., Sánchez, M., Polanía, C. & León, A. 2005. Ferns and Melastomataceae as indicators of vascular plant composition in rain forests of Colombian Amazonia. *Plant Ecology* **178**:1–13.
- Ellenberg, H. 1988. *Vegetation ecology of Central Europe*. Cambridge University Press, Cambridge. 753 pp.
- Faith, D. P. & Walker, P. A. 1996. How do indicator groups provide information about the relative biodiversity of different sets of areas?: on hotspots, complementarity and pattern-based approaches. *Biodiversity Letters* **3**:18–25.
- Ferrier, S. 2002. Mapping spatial pattern in biodiversity for regional conservation planning: where to from here? *Systematic Biology* **51**:331–363.
- Figueiredo, J., C. Hoorn, P. van der Ven, and E. Soares. 2009. Late Miocene onset of the Amazon River and the Amazon deep-sea fan: Evidence from the Foz do Amazonas Basin. *Geology* **37**:619-622.
- Fine, P. V. A., D. C. Daly, G. V. Munoz, I. Mesones, and K. M. Cameron. 2005. The contribution of edaphic heterogeneity to the evolution and diversity of Burseraceae trees in the western Amazon. *Evolution* **59**:1464-1478.
- Finer, M., C. N. Jenkins, S. L. Pimm, B. Keane, and C. Ross. 2008. Oil and Gas Projects in the Western Amazon: Threats to Wilderness, Biodiversity, and Indigenous Peoples. *Plos One* **3**:1-9.

- Finer, M., and M. Orta-Martinez. 2010. A second hydrocarbon boom threatens the Peruvian Amazon: trends, projections, and policy implications. *Environmental Research Letters* **5**:1-10.
- Gégout, J.-C., Hervé, J.-C., Houllier, F. & Pierrat, J.-C. 2003. Prediction of forest soil nutrient status using vegetation. *Journal of Vegetation Science* **14**:55–62.
- Gentry, A. H. 1988. Tree species richness of upper Amazonian forests. *Proceedings of the National Academy of Sciences of the United States of America* **85**:156-159.
- Grossman, D. H., A. S. Faber-Langendoen, A. S. Weakley, M. Anderson, P. Bourgeron, R. Crawford, K. Goodin, S. Landaal, K. Metzler, K. Patterson, M. Pyne, M. Reid, and L. Sneddon. 1998. *International Classification of Ecological Communities: Terrestrial Vegetation of the United States. Volume II. The National Vegetation Classification System.* The Nature Conservancy, Arlington, Virginia.
- Groves, C., L. Valutis, D. Vosick, B. Neely, K. Wheaton, J. Touval, and B. Runnels. 2000. *Designing a geography of hope: a practitioner's handbook for ecoregional conservation planning.* The Nature Conservancy, Washington, D.C.
- Hayes, F. E., and J. A. N. Sewlal. 2004. The Amazon River as a dispersal barrier to passerine birds: effects of river width, habitat and taxonomy. *Journal of Biogeography* **31**:1809-1818.
- Higgins, M. A., and K. Ruokolainen. 2004. Rapid tropical forest inventory: a comparison of techniques based on inventory data from western Amazonia. *Conservation Biology* **18**:799-811.
- Hill, R. A., and G. M. Foody. 1994. Separability of Tropical Rain-Forest Types in the Tambopata-Candamo Reserved Zone, Peru. *International Journal of Remote Sensing* **15**:2687-2693.
- Holmgren, P. K., Holmgren, N. H. & Barnett, L. C. 1990. *Index herbariorum.* New York Botanical Garden, New York. 693 pp.
- Honorio Coronado, E. N., T. R. Baker, O. L. Phillips, N. C. A. Pitman, R. T. Pennington, R. Vasquez Martinez, A. Monteagudo, H. Mogollon, N. Davila Cardozo, M. Rios, R. Garcia-Villacorta, E. Valderrama, M. Ahuite, I. Huamantupa, D. A. Neill, W. F. Laurance, H. E. M. Nascimento, S. S. de Almeida, T. J. Killeen, L. Arroyo, P. Nunez, and L. Freitas Alvarado. 2009. Multi-scale comparisons of tree composition in Amazonian terra firme forests. *Biogeosciences* **6**:ISSN 1726-4170(print)|1726-4189(electronic).

- Hoorn, C. 1994. An Environmental Reconstruction Of The Palaeo-Amazon River System (Middle-Late Miocene, Nw Amazonia). *Palaeogeography Palaeoclimatology Palaeoecology* **112**:187-238.
- Hovikoski, J., M. Räsänen, M. Gingras, M. Roddaz, S. Brusset, W. Hermoza, and L. R. Pittman. 2005. Miocene semidiurnal tidal rhythmites in Madre de dios, Peru. *Geology* **33**:177-180.
- Hubbell, S. P. 2001. *The Unified Neutral Theory of Biodiversity and Biogeography*. Princeton University Press, Princeton, NJ.
- Huber, O. & Alarcón, C. 1988. Mapa de vegetación de Venezuela. Ministerio del ambiente y de los recursos naturales renovables, Caracas.
- IBGE. 2004. Mapa de Vegetação do Brasil, Third edition. Fundação Instituto Brasileiro de Geografia e Estatística, Ministério da Agricultura, Rio de Janeiro.
- INGEMMET. 2000. Mapa Geológico del Perú. Instituto Geologico Minero Y Metalurgico, Lima.
- Irion, G. 1984. Clay minerals of Amazonian soils. Pages 537-579 *in* H. Sioli, editor. *The Amazon: Limnology and landscape ecology of a mighty tropical river and its basin*. Dr. W. Junk Publishers, Dordrecht, Boston, Lancaster.
- John, R., J. W. Dalling, K. E. Harms, J. B. Yavitt, R. F. Stallard, M. Mirabello, S. P. Hubbell, R. Valencia, H. Navarrete, M. Vallejo, and R. B. Foster. 2007. Soil nutrients influence spatial distributions of tropical tree species. *Proceedings of the National Academy of Sciences of the United States of America* **104**:864-869.
- Jones, M. M., H. Tuomisto, and P. C. Olivas. 2008. Differences in the degree of environmental control on large and small tropical plants: just a sampling effect? *Journal of Ecology* **96**:367-377.
- Kent, M., and P. Coker. 1992. *Vegetation description and analysis: a practical approach*. CRC Press, Ann Arbor, Michigan.
- Kessler, M., and K. Bach. 1999. Using indicator families for vegetation classification in species-rich Neotropical forests. *Phytocoenologia* **29**:485-502.
- Legendre, P., F. J. Lapointe, and P. Casgrain. 1994. Modeling Brain Evolution from Behavior - a Permutational Regression Approach. *Evolution* **48**:1487-1499.



- Legendre, P., and L. Legendre. 1998. Numerical ecology. Elsevier Science, Amsterdam, The Netherlands.
- Legendre, P. 2000. Comparison of permutation methods for the partial correlation and partial Mantel tests. *Journal of Statistical Computation and Simulation* **67**:37-73.
- Lips, J. & Duivenvoorden, J. F. 2001. Caracterización ambiental. Pp. 19–45 in Duivenvoorden, J. F., Balslev, H., Cavelier, J., Grandez, C., Tuomisto, H. & Valencia, R. (eds). Evaluación de recursos vegetales no maderables en la Amazonía noroccidental. IBED, Universiteit van Amsterdam, Amsterdam.
- Macia, M. J., and J. C. Svenning. 2005. Oligarchic dominance in western Amazonian plant communities. *Journal of Tropical Ecology* **21**:613-626.
- Malhi, Y., T. R. Baker, O. L. Phillips, S. Almeida, E. Alvarez, L. Arroyo, J. Chave, C. I. Czimczik, A. Di Fiore, N. Higuchi, T. J. Killeen, S. G. Laurance, W. F. Laurance, S. L. Lewis, L. M. M. Montoya, A. Monteagudo, D. A. Neill, P. N. Vargas, S. Patino, N. C. A. Pitman, C. A. Quesada, R. Salomao, J. N. M. Silva, A. T. Lezama, R. V. Martinez, J. Terborgh, B. Vinceti, and J. Lloyd. 2004. The above-ground coarse wood productivity of 104 Neotropical forest plots. *Global Change Biology* **10**:563-591.
- Malhi, Y., J. T. Roberts, R. A. Betts, T. J. Killeen, W. H. Li, and C. A. Nobre. 2008. Climate change, deforestation, and the fate of the Amazon. *Science* **319**:169-172.
- Malhi, Y., D. Wood, T. R. Baker, J. Wright, O. L. Phillips, T. Cochrane, P. Meir, J. Chave, S. Almeida, L. Arroyo, N. Higuchi, T. J. Killeen, S. G. Laurance, W. F. Laurance, S. L. Lewis, A. Monteagudo, D. A. Neill, P. N. Vargas, N. C. A. Pitman, C. A. Quesada, R. Salomao, J. N. M. Silva, A. T. Lezama, J. Terborgh, R. V. Martinez, and B. Vinceti. 2006. The regional variation of aboveground live biomass in old-growth Amazonian forests. *Global Change Biology* **12**:1107-1138.
- Margules, C. R., and R. L. Pressey. 2000. Systematic conservation planning. *Nature* **405**:243-253.
- McCune, B. & Allen, T. F. H. 1985. Will similar forest develop on similar sites? *Canadian Journal of Botany* **63**:367–376.
- McCune, B., and M. J. Mefford. 1999. PC-ORD. Multivariate analysis of ecological data. Version 4. MjM Software Design, Glenden Beach, Oregon.
- Noss, R. F., and L. D. Harris. 1986. Nodes, networks, and MUMs: preserving diversity at all scales. *Environmental Management* **10**:299-309.

- Noss, R. F., J. R. Strittholt, K. Vance-Borland, C. Carroll, and P. Frost. 1999. A conservation plan for the Klamat-Siskiyou ecoregion. *Natural Areas Journal* **19**:392-411.
- Oliveira, P. J. C., G. P. Asner, D. E. Knapp, A. Almeyda, R. Galvan-Gildemeister, S. Keene, R. F. Raybin, and R. C. Smith. 2007. Land-use allocation protects the Peruvian Amazon. *Science* **317**:1233-1236.
- Oliver, I., Beattie, A. J. & York, A. 1998. Spatial fidelity of plant, vertebrate, and invertebrate assemblages in multiple-use forest in eastern Australia. *Conservation Biology* **12**:822–835.
- Olson, D. M., E. Dinerstein, G. V. N. Powell, and E. D. Wikramanayake. 2002. Conservation biology for the biodiversity crisis. *Conservation Biology* **16**:1-3.
- Olson, D. M., et al. 2001. Terrestrial ecoregions of the world: a new map of life on Earth. *BioScience* **51**: 933-938.
- Palmiotto P.A., S. J. Davies, K.A. Vogt, M. A. Ashton, D. J. Vogt, P.S. Ashton. 2004. Soil-related habitat specialization in dipterocarp rain forest tree species in Borneo. *Journal of Ecology* **92**:609-623
- Patton, J. L., M. N. F. Dasilva, and J. R. Malcolm. 1994. Gene Genealogy and Differentiation among Arboreal Spiny Rats (Rodentia, Echimyidae) of the Amazon Basin - a Test of the Riverine Barrier Hypothesis. *Evolution* **48**:1314-1323.
- Pearson, D.L. 1995. Selecting indicator taxa for the quantitative assessment of biodiversity. Pages 75-79 in D.L. Hawksworth, editor. *Biodiversity measurement and estimation*. Chapman and Hall, London, UK.
- Phillips, O. L., L. E. O. C. Aragao, S. L. Lewis, J. B. Fisher, J. Lloyd, G. Lopez-Gonzalez, Y. Malhi, A. Monteagudo, J. Peacock, C. A. Quesada, G. van der Heijden, S. Almeida, I. Amaral, L. Arroyo, G. Aymard, T. R. Baker, O. Banki, L. Blanc, D. Bonal, P. Brando, J. Chave, A. C. A. de Oliveira, N. D. Cardozo, C. I. Czimczik, T. R. Feldpausch, M. A. Freitas, E. Gloor, N. Higuchi, E. Jimenez, G. Lloyd, P. Meir, C. Mendoza, A. Morel, D. A. Neill, D. Nepstad, S. Patino, M. C. Penuela, A. Prieto, F. Ramirez, M. Schwarz, J. Silva, M. Silveira, A. S. Thomas, H. ter Steege, J. Stropp, R. Vasquez, P. Zelazowski, E. A. Davila, S. Andelman, A. Andrade, K. J. Chao, T. Erwin, A. Di Fiore, E. Honorio, H. Keeling, T. J. Killeen, W. F. Laurance, A. P. Cruz, N. C. A. Pitman, P. N. Vargas, H. Ramirez-

- Angulo, A. Rudas, R. Salamao, N. Silva, J. Terborgh, and A. Torres-Lezama. 2009. Drought Sensitivity of the Amazon Rainforest. *Science* **323**:1344-1347.
- Phillips, O. L., T. R. Baker, L. Arroyo, N. Higuchi, T. J. Killeen, W. F. Laurance, S. L. Lewis, J. Lloyd, Y. Malhi, A. Monteagudo, D. A. Neill, P. N. Vargas, J. N. M. Silva, J. Terborgh, R. V. Martinez, M. Alexiades, S. Almeida, S. Brown, J. Chave, J. A. Comiskey, C. I. Czimczik, A. Di Fiore, T. Erwin, C. Kuebler, S. G. Laurance, H. E. M. Nascimento, J. Olivier, W. Palacios, S. Patino, N. C. A. Pitman, C. A. Quesada, M. Salidas, A. T. Lezama, and B. Vinceti. 2004. Pattern and process in Amazon tree turnover, 1976-2001. *Philosophical Transactions of the Royal Society of London Series B-Biological Sciences* **359**:381-407.
- Phillips, O. L., and J. S. Miller. 2002. Global patterns of plant diversity: Alwyn H. Gentry's Forest Transect Data Set. Missouri Botanical Garden Press, St. Louis, Missouri.
- Phillips, O. L., P. N. Vargas, A. L. Monteagudo, A. P. Cruz, M. E. C. Zans, W. G. Sanchez, M. Yli-Halla, and S. Rose. 2003a. Habitat association among Amazonian tree species: a landscape-scale approach. *Journal of Ecology* **91**:757-775.
- Phillips, O. L., R. Vasquez Martinez, P. Nunez Vargas, A. Lorenzo Monteagudo, M. E. Chuspe Zans, W. Galiano Sanchez, A. Pena Cruz, M. Timana, M. Yli-Halla, and S. Rose. 2003b. Efficient plot-based floristic assessment of tropical forests. *Journal of Tropical Ecology* **19**:629-645.
- Pitman, N. C. A., H. Mogollon, N. Davila, M. Rios, R. Garcia-Villacorta, J. Guevara, T. R. Baker, A. Monteagudo, O. L. Phillips, R. Vasquez-Martinez, M. Ahuite, M. Aulestia, D. Cardenas, C. E. Ceron, P. A. Loizeau, D. A. Neill, N. V. Percy, W. A. Palacios, R. Spichiger, and E. Valderrama. 2008. Tree community change across 700 km of lowland Amazonian forest from the Andean foothills to Brazil. *Biotropica* **40**:525-535.
- Pitman, N. C. A., J. Terborgh, M. R. Silman, and P. Nunez V. 1999. Tree species distributions in an upper Amazonian forest. *Ecology* **80**:2651-2661.
- Pitman, N. C. A., J. W. Terborgh, M. R. Silman, P. Nunez, D. A. Neill, C. E. Ceron, W. A. Palacios, and M. Aulestia. 2001. Dominance and distribution of tree species in upper Amazonian terra firme forests. *Ecology* **82**:2101-2117.
- Pitman, N.C.A., C. Vriesendorp, and D. Moskovits (eds.). 2003. Perú: Yavarí. Rapid Biological Inventories Report 11. Chicago, IL: The Field Museum.

- Potts, M. D., Ashton, P. S., Kaufman, L. S. & Plotkin, J. B. 2002. Habitat patterns in tropical rain forests: a comparison of 105 plots in northwest Borneo. *Ecology* **83**:2782–2797.
- Prance, G.T. 1990. American tropical forests. Pages 99-132 in H. Leith & M.J.A. Werger, editors. *Ecosystems of the world 14B. Tropical rain forest ecosystems: biogeographical and ecological studies*. Elsevier, Amsterdam, Netherlands.
- Prance, G. T. 1994. A comparison of the efficacy of higher taxa and species numbers in the assessment of biodiversity in the neotropics. *Philosophical Transactions Of The Royal Society Of London Series B-Biological Sciences* **345**:89-99.
- Räsänen, M., R. Neller, J. Salo, and H. Jungner. 1992. Recent and Ancient Fluvial Deposition Systems in the Amazonian Foreland Basin, Peru. *Geological Magazine* **129**:293-306.
- Räsänen, M. E., A. M. Linna, J. C. R. Santos, and F. R. Negri. 1995. Late Miocene Tidal Deposits in the Amazonian Foreland Basin. *Science* **269**:386-390.
- Räsänen, M. E., J. S. Salo, H. Jungner, and L. R. Pittman. 1990. Evolution of the western Amazonian lowland relief: impact of Andean foreland dynamics. *Terra Nova* **2**:320-332.
- Räsänen, M. E., J. S. Salo, and R. J. Kalliola. 1987. Fluvial Perturbance in the Western Amazon Basin - Regulation by Long-Term Sub-Andean Tectonics. *Science* **238**:1398-1401.
- Rebata, L. A., M. K. Gingras, M. E. Räsänen, and M. Barberi. 2006. Tidal-channel deposits on a delta plain from the Upper Miocene Nauta Formation, Marañon Foreland Sub-basin, Peru. *Sedimentology* **53**:971-1013.
- Resampling Stats Inc. 1999. *Resampling Stats. Version 4.1*. Resampling Stats Inc., Arlington, Virginia.
- Ribas, C. C., C. Y. Miyaki, and J. Cracraft. 2009. Phylogenetic relationships, diversification and biogeography in Neotropical *Brotogeris* parakeets. *Journal of Biogeography* **36**:1712-1729.
- Richardson, J. E., R. T. Pennington, T. D. Pennington, and P. M. Hollingsworth. 2001. Rapid diversification of a species-rich genus of neotropical rain forest trees. *Science* **293**:2242-2245.

- Roddaz, M., P. Baby, S. Brusset, W. Hermoza, and J. M. Darrozes. 2005. Forebulge dynamics and environmental control in Western Amazonia: The case study of the Arch of Iquitos (Peru). *Tectonophysics* **399**:87-108.
- Rodriguez, E., C. S. Morris, and J. E. Belz. 2006. A global assessment of the SRTM performance. *Photogrammetric Engineering and Remote Sensing* **72**:249-260.
- Romero-Saltos, H., Valencia, R. & Macía, M. J. 2001. Patrones de diversidad, distribución y rareza de plantas leñosas en el Parque Nacional Yasuní y la Reserva Étnica Huaorani, Amazonía ecuatoriana. Pp. 131–162 in Duivenvoorden, J. F., Balslev, H., Cavelier, J., Grandez, C., Tuomisto, H. & Valencia, R. (eds). Evaluación de recursos vegetales no maderables en la Amazonía noroccidental. IBED, Universiteit van Amsterdam, Amsterdam.
- Rossetti, D. D., P. M. de Toledo, and A. M. Goes. 2005. New geological framework for Western Amazonia (Brazil) and implications for biogeography and evolution. *Quaternary Research* **63**:78-89.
- Rossetti, D. F., and M. M. Valeriano. 2007. Evolution of the lowest amazon basin modeled from the integration of geological and SRTM topographic data. *Catena* **70**:253-265.
- Ruokolainen, K., A. Linna, and H. Tuomisto. 1997. Use of Melastomataceae and pteridophytes for revealing phytogeographical patterns in Amazonian rain forests. *Journal of Tropical Ecology* **13**:243-256.
- Ruokolainen, K., and H. Tuomisto. 1998. Vegetación natural de la zona de Iquitos. R. Kalliola and S. Flores, editors. *Geoecología y desarrollo Amazonico: estudio integrado en la zona de Iquitos, Perú*. *Annales Universitatis Turkuensis Series A II* **114**:253-365.
- Ruokolainen, K., H. Tuomisto, M. J. Macia, M. A. Higgins, and M. Yli-Halla. 2007. Are floristic and edaphic patterns in Amazonian rain forests congruent for trees, pteridophytes and Melastomataceae? *Journal of Tropical Ecology* **23**:13-25.
- Ruokolainen, K., Tuomisto, H., Vormisto, J. & Pitman, N. 2002. Potential effects of two biases on estimating Amazonian plant distributions. *Journal of Tropical Ecology* **18**:935–942.
- Ruokolainen, K. & Vormisto, J. 2000. The most widespread Amazonian palms tend to be tall and habitat generalists. *Basic and Applied Ecology* **1**:97–108.

- Sagers, C. L. & Lyon, J. 1997. Gradient analysis in a riparian landscape: contrasts among forest layers. *Forest Ecology and Management* **96**:13–26.
- Salovaara, K. J., G. G. Cardenas, and H. Tuomisto. 2004. Forest classification in an Amazonian rainforest landscape using pteridophytes as indicator species. *Ecography* **27**:689-700.
- Salovaara, K. J., S. Thessler, R. N. Malik, and H. Tuomisto. 2005. Classification of Amazonian primary rain forest vegetation using Landsat ETM plus satellite imagery. *Remote Sensing of Environment* **97**:39-51.
- Sanchez, P. A., and S. W. Buol. 1974. Properties of Some Soils of Upper Amazon Basin of Peru. *Soil Science Society of America Journal* **38**:117-121.
- Sayre, R., E. Roca, G. Sedaghatkish, B. Young, S. Keel, R. Roca, and S. Sheppard. 2000. *Nature in focus: rapid ecological assessment*. Island Press, Washington, D.C.
- Schobbenhaus, C., J. H. Gonçalves, J. O. S. Santos, M. B. Abram, R. Leao Neto, G. M. M. Matos, R. M. Vidotti, M. A. B. Ramos, and J. D. A. Jesus. 2004. Carta geológica do Brasil ao Milionésimo, System de Informações Geográficas-SIG / Geological map of Brazil, 1:1,000,000 scale, Geographic Information System-GIS. 41 CD-ROM. CPRM, Geological Survey of Brasil, Brasilia.
- Schulenberg, T. S., D. F. Stotz, D. F. Lane, J. P. O'Neill, and T. A. Parker. 2007. *Birds of Peru*. Princeton University Press, Princeton, NJ.
- Silva, J. M. C. D., and D. C. Oren. 1996. Application of parsimony analysis of endemism in Amazonian biogeography: An example with primates. *Biological Journal of the Linnean Society* **59**:427-437.
- Soares, B. S., D. C. Nepstad, L. M. Curran, G. C. Cerqueira, R. A. Garcia, C. A. Ramos, E. Voll, A. McDonald, P. Lefebvre, and P. Schlesinger. 2006. Modelling conservation in the Amazon basin. *Nature* **440**:520-523.
- Sokal, R. R., and F. J. Rohlf. 1995. *Biometry*. W. H. Freeman, New York.
- Sombroek, W. G. 1991. Amazon landforms and soils in relation to biological diversity. Working Paper and Preprint no. 91/5, ISRIC, Wageningen.
- Soulé, M. E., and J. Terborgh. 1999. The policy and science of regional conservation. Pages 1-17 in M. E. Soule and J. Terborgh, editors. *Continental conservation: scientific foundations of regional reserve networks*. Island Press, Washington, D.C.

- ter Steege, H., N. C. A. Pitman, O. L. Phillips, J. Chave, D. Sabatier, A. Duque, J. F. Molino, M. F. Prevoist, R. Spichiger, H. Castellanos, P. von Hildebrand, and R. Vasquez. 2006. Continental-scale patterns of canopy tree composition and function across Amazonia. *Nature* **443**:444-447.
- ter Steege, H., D. Sabatier, H. Castellanos, T. Van Andel, J. Duivenvoorden, A. A. De Oliveira, R. Ek, R. Lilwah, P. Maas, and S. Mori. 2000. An analysis of the floristic composition and diversity of Amazonian forests including those of the Guiana Shield. *Journal of Tropical Ecology* **16**:801-828.
- Svenning, J.-C., Kinner, D. A., Stallard, R. F., Engelbrecht, B. M. J. & Wright, S. J. 2004. Ecological determinism in plant community structure. *Ecology* **85**:2526–2538.
- Terborgh, J. 1992. Diversity and the tropical rain forest. Scientific American Library : Distributed by W.H. Freeman, New York.
- Terborgh, J. N., Pitman, N., Silman, M., Schlichter, H. & Núñez V., P. 2002. Maintenance of tree diversity in tropical forests. Pp. 1-17 in Levey, D. J., Silva, W. & Galetti, M. (eds). Seed dispersal and frugivory: ecology, evolution and conservation. CAB International, Wallingford.
- Thessler, S., K. Ruokolainen, H. Tuomisto, and E. Tomppo. 2005. Mapping gradual landscape-scale floristic changes in Amazonian primary rain forests by combining ordination and remote sensing. *Global Ecology and Biogeography* **14**:315-325.
- Toivonen, T., R. Kalliola, K. Ruokolainen, and R. N. Malik. 2006. Across-path DN gradient in Landsat TM imagery of Amazonian forests: A challenge for image interpretation and mosaicking. *Remote Sensing of Environment* **100**:550-562.
- Tucker, C. J., D. M. Grant, and J. D. Dykstra. 2004. NASA's global orthorectified landsat data set. *Photogrammetric Engineering and Remote Sensing* **70**:313-322.
- Tuomisto, H., A. Linna, and R. Kalliola. 1994. Use of Digitally Processed Satellite Images in Studies of Tropical Rain-Forest Vegetation. *International Journal of Remote Sensing* **15**:1595-1610.
- Tuomisto, H., and A. Poulsen. 1996. Influence of edaphic specialization on pteridophyte distribution in neotropical rain forests. *Journal of Biogeography* **23**:283-293.
- Tuomisto, H., A. D. Poulsen, and R. C. Moran. 1998. Edaphic distributions of some species of the fern genus *Adiantum* in western Amazonia. *Biotropica* **30**:392-399.

- Tuomisto, H., and K. Ruokolainen. 1994. Distribution of Pteridophyta and Melastomataceae along an edaphic gradient in an Amazonian rain forest. *Journal of Vegetation Science* **5**:25-34.
- Tuomisto, H., A. D. Poulsen, K. Ruokolainen, R. C. Moran, C. Quintana, J. Celi, and G. Canas. 2003a. Linking floristic patterns with soil heterogeneity and satellite imagery in Ecuadorian Amazonia. *Ecological Applications* **13**:352-371.
- Tuomisto, H., K. Ruokolainen, M. Aguilar, and A. Sarmiento. 2003b. Floristic patterns along a 43-km long transect in an Amazonian rain forest. *Journal of Ecology* **91**:743-756.
- Tuomisto, H., K. Ruokolainen, R. Kalliola, A. Linna, W. Danjoy, and Z. Rodriguez. 1995. Dissecting Amazonian Biodiversity. *Science* **269**:63-66.
- Tuomisto, H., K. Ruokolainen, and M. Yli-Halla. 2003c. Dispersal, environment, and floristic variation of western Amazonian forests. *Science* **299**:241-244.
- Valencia, R., H. Balslev, and G. P. Y. Mino. 1994. High Tree Alpha-Diversity in Amazonian Ecuador. *Biodiversity and Conservation* **3**:21-28.
- Van Reeuwijk, L. P. 1993. Procedures for soil analysis. (Fourth edition). ISRIC Technical Paper 9. Wageningen, The Netherlands. 95 pp.
- Vayssières, M. P., R. E. Plant, and B. H. Allen-Diaz. 2000. Classification trees: An alternative non-parametric approach for predicting species distributions. *Journal of Vegetation Science* **11**:679-694.
- Vellend, M. 2001. Do commonly used indices of b-diversity measure species turnover? *Journal of Vegetation Science* **12**:545-552.
- Vormisto, J., O. L. Phillips, K. Ruokolainen, H. Tuomisto, and R. Vasquez. 2000. A comparison of fine-scale distributions of four plant groups in an Amazonian rainforest. *Ecography* **23**:349-359.
- Vormisto, J., Svenning, J.-C., Hall, P. & Balslev, B. 2004. Diversity and dominance in palm (Arecaceae) communities in terra firme forests in the western Amazon basin. *Journal of Ecology* **92**:577-588.
- Webb, L. J., J. G. Tracey, W. T. Williams, and G. N. Lance. 1967. Studies in the numerical analyses of complex rain-forest communities: II. The problem of species sampling. *Journal of Ecology* **55**:525-538.



- Wesselingh, F. P., M. E. Rasanen, G. Irion, H. B. Vonhof, R. Kaandorp, W. Renema, L. Romero Pittman, and M. Gingras. 2002. Lake Pebas: a palaeoecological reconstruction of a Miocene, long-lived lake complex in western Amazonia. *Cainozoic Research* **1**:35-81.
- Wikramanayake, E., E. Dinerstein, C. Loucks, D. Olson, J. Morrison, J. Lamoreux, M. McKnight, and P. Hedao. 2002. Ecoregions in ascendance: reply to Jepson and Whittaker. *Conservation Biology* **16**:238-243.
- Wilson, S. M., Pyatt, D. G., Malcolm, D. C. & Connolly, T. 2001. The use of ground vegetation and humus type as indicators of soil nutrient regime for an ecological site classification of British forests. *Forest Ecology and Management* 140:101–116.
- Wolda, H. 1981. Similarity indices, sample size, and diversity. *Oecologia* **50**:296–302.
- Young, K. R & León, B. 1989. Pteridophyte species diversity in the central Peruvian Amazon: importance of edaphic specialization. *Brittonia* **41**:388–395.

## Biography

I was born April 20, 1973, in London, England. I graduated from Princeton University with a BA in molecular biology in 1995; and received an MS in conservation ecology from the University of Georgia in 2000. After one year as a visiting researcher at the Department of Biology at the University of Turku, Finland, I came to Duke in 2002 to begin my dissertation work in tropical ecology.

### PUBLICATIONS

Ruokolainen, K., Tuomisto, H., Macia, M.J., Higgins, M.A., and M. Yli-Halla. 2007. Are floristic and edaphic patterns in Amazonian rain forests congruent for trees, pteridophytes, and Melastomataceae? *Journal of Tropical Ecology* 23:13-25

Schulman, L., Ruokolainen, K., Junikka, L., Sääksjärvi, I. E., Salo, M., Juvonen, S.-K., Salo, J. & Higgins, M. 2007. Amazonian biodiversity and protected areas: do they meet? *Biodiversity and Conservation* 16: 3011-3051.

Higgins, M.A., and K. Ruokolainen. 2004. Rapid tropical forest inventory: a comparison of techniques using inventory data from western Amazonia. *Conservation Biology* 18(3):799-811

### HONORS AND FELLOWSHIPS

American-Scandinavian Foundation Research Fellowship (New York, USA), 2006 to 2007

Graduate School Award for International Research (Duke University), 2004

Latin American Studies Award for International Research (Duke University), 2004

Aleane Webb Dissertation Research Fellowship (Duke University), 2004

Sigma Xi Society Sally Schrader-Hughes Travel Award (Duke University chapter), 2003

National Science Foundation Graduate Research Fellowship (NSF, USA), 2002 to 2006

Center for International Mobility Fellowship (University of Turku, Finland), 2001 & 2002

University-Wide Graduate Fellowship (University of Georgia, USA), 1998 to 2000