

ACCEPTED MANUSCRIPT

A comparison of COVID-19 and imaging radiation risk in clinical patient populations

To cite this article before publication: Francesco Ria *et al* 2020 *J. Radiol. Prot.* in press <https://doi.org/10.1088/1361-6498/abbf3b>

Manuscript version: Accepted Manuscript

Accepted Manuscript is “the version of the article accepted for publication including all changes made as a result of the peer review process, and which may also include the addition to the article by IOP Publishing of a header, an article ID, a cover sheet and/or an ‘Accepted Manuscript’ watermark, but excluding any other editing, typesetting or other changes made by IOP Publishing and/or its licensors”

This Accepted Manuscript is © 2020 Society for Radiological Protection. Published on behalf of SRP by IOP Publishing Limited. All rights reserved..

During the embargo period (the 12 month period from the publication of the Version of Record of this article), the Accepted Manuscript is fully protected by copyright and cannot be reused or reposted elsewhere.

As the Version of Record of this article is going to be / has been published on a subscription basis, this Accepted Manuscript is available for reuse under a CC BY-NC-ND 3.0 licence after the 12 month embargo period.

After the embargo period, everyone is permitted to use copy and redistribute this article for non-commercial purposes only, provided that they adhere to all the terms of the licence <https://creativecommons.org/licenses/by-nc-nd/3.0>

Although reasonable endeavours have been taken to obtain all necessary permissions from third parties to include their copyrighted content within this article, their full citation and copyright line may not be present in this Accepted Manuscript version. Before using any content from this article, please refer to the Version of Record on IOPscience once published for full citation and copyright details, as permissions will likely be required. All third party content is fully copyright protected, unless specifically stated otherwise in the figure caption in the Version of Record.

View the [article online](#) for updates and enhancements.

A comparison of COVID-19 and imaging radiation risk in clinical patient populations

Francesco Ria, Doctor of Medical Physics (corresponding author)

Carl E. Ravin Advanced Imaging Labs and Clinical Imaging Physics Group, Duke University Health System

2424 Erwin Road, Suite 302, Durham, NC 27710

Tel: (919) 668-6197; Fax: (919) 684-1491

francesco.ria@duke.edu

Wanyi Fu, M.S.

Carl E. Ravin Advanced Imaging Labs, Duke University Health System

2424 Erwin Road, Suite 302, Durham, NC 27710

wanyi.fu@duke.edu

Hamid Chalian, M.D.

Radiology Department, Duke University Health System

2301 Erwin Road, Durham, NC 27710

hamid.chalian@duke.edu

Ehsan Abadi, Ph.D.

Carl E. Ravin Advanced Imaging Labs, Duke University Health System

2424 Erwin Road, Suite 302, Durham, NC 27710

ehsan.abadi@duke.edu

Paul W. Segars, Ph.D.

Carl E. Ravin Advanced Imaging Labs, Duke University Health System

2424 Erwin Road, Suite 302, Durham, NC 27710

paul.segars@duke.edu

Rafael Fricks, Ph.D.

Department of Veterans Affairs

508 Fulton St, Durham, NC, 27705

Carl E. Ravin Advanced Imaging Labs, Duke University Health System

2424 Erwin Road, Suite 302, Durham, NC 27710

rafael.fricks@duke.edu

Pegah Khoshpouri, M.D.

Radiology Department, Duke University Health System

2301 Erwin Road, Durham, NC 27710

pegah.khoshpouri@duke.edu

Ehsan Samei, Ph.D.

Carl E. Ravin Advanced Imaging Labs, Clinical Imaging Physics Group, Medical Physics Graduate Program,

Departments of Radiology, Physics, Biomedical Engineering, and Electrical and Computer Engineering,

Duke University

2424 Erwin Road, Suite 302, Durham, NC 27710

ehsan.samei@duke.edu

1. ABSTRACT

Objective. The outbreak of coronavirus SARS-COV2 affected more than 180 countries necessitating fast and accurate diagnostic tools. Reverse transcriptase polymerase chain reaction (RT-PCR) has been identified as a gold standard test with Chest CT and Chest Radiography showing promising results as well. However, radiological solutions have not been used extensively for the diagnosis of COVID-19 disease, partly due to radiation risk. This study aimed to provide quantitative comparison of imaging radiation risk versus COVID risk.

Methods. The analysis was performed in terms of mortality rate per age group. COVID-19 mortality was extracted from epidemiological data across 299,004 patients published by ISS-Integrated surveillance of COVID-19 in Italy. For radiological risk, the study considered 659 Chest CT performed in adult patients. Organ doses were estimated using a Monte Carlo method and then used to calculate Risk Index that was converted into an upper bound for related mortality rate following NCI-SEER data.

Results. COVID-19 mortality showed a rapid rise for ages >30 years old (min:0.30%; max:30.20%), whereas only 1 death was reported in the analyzed patient cohort for ages <20 years old. The rates decreased for radiation risk across age groups. The median mortality rate across all ages for Chest-CT and Chest-Radiography were 0.007% (min:0.005%; max:0.011%) and 0.0003% (min:0.0002%; max:0.0004%), respectively.

Conclusions. COVID-19, Chest Radiography, and Chest CT mortality rates showed different magnitudes and trends across age groups. In higher ages, the risk of COVID-19 far outweighs that of radiological exams. Based on risk comparison alone, Chest Radiography and CT for COVID-19 care is justified for patients older than 20 and 30 years old, respectively. Notwithstanding other aspects of diagnosis, the present results capture a component of risk consideration associated with the use of imaging for COVID. Once integrated with other diagnostic factors, they may help inform better management of the pandemic.

2. KEYWORDS

COVID-19; mortality; radiation risk; X-Ray Computed Tomography; X-Ray Radiography

3. INTRODUCTION

Between December 2019 and June 15th 2020, 8 million cases of coronavirus SARS-COV2 disease (COVID-19) have been reported, with over 434,000 attributed deaths worldwide.¹⁻² More than 180 countries report an outbreak, with the US showing the largest number of cases. On January 30th 2020, the World Health Organization (WHO) declared the pandemic a “public emergency of international concern”. In this landscape, accurate and fast diagnosis is one of the most necessary tools to curb the spread of the disease.

To date, the gold standard diagnostic method for COVID-19 has been reverse transcriptase polymerase chain reaction (RT-PCR).³ However, this diagnostic test tends to be slow, requires a specific manufacturing process, is not always promptly available, and can have a varied sensitivity within the range of 60-95%.⁴ Because the infected patients often have lung involvements, radiological imaging has been used in many affected countries as an alternative for diagnosis of the disease. Frequent imaging findings are bilateral

1
2
3 pulmonary ground-glass opacities and consolidations with peripheral predominance.⁵ Chest CT and Chest
4 Radiography have shown promising performance with CT sensitivity reported to be up to 98%.⁶⁻⁸ The
5 World Health Organization recently published a rapid advice guide in the use of chest imaging in Covid-
6 19. The report identified 22 studies that evaluated the accuracy of Chest CT and Chest Radiography in the
7 diagnosis of Covid-19. The median sensitivity and specificity were 0.92 and 0.56 for Chest CT; and 0.64
8 and 0.92 for Chest Radiography.⁹ Imaging, therefore, can potentially offer an additional tool for the
9 diagnosis or follow-up in the pandemic. Nevertheless, several international institutions are discouraging
10 the use of radiological studies for the diagnosis of coronavirus infection. In particular, the American
11 College of Radiology recommends that “CT should not be used to screen for or as a first-line test to
12 diagnose COVID-19” and the Center for Disease Control (CDC) does not currently recommend the use of
13 radiological imaging to diagnose COVID-19.¹⁰

14
15
16
17 Despite the reservations, the need for rapid diagnosis to mitigate a rapidly spreading pandemic is at an
18 all-time high, and radiological examination is continuing to be used in many countries for the early
19 diagnosis of the disease and its follow-up. Such use should be primarily dictated by the sensitivity and
20 specificity of the procedure. But in addition, the use of radiological exams has an associated radiation risk.
21 This risk is obviously not the primary factor that should be taken into account for justifying the use of
22 imaging in COVID care; nonetheless, it is a factor that is of high public concern needing an explicit
23 management of its own. This is particularly the case considering the differing radiation burdens of CT and
24 Radiography, regardless of their diagnostic accuracy.

25
26
27 The purpose of this study was to compare, in real clinical populations, the COVID-19 infection mortality
28 risk versus the intrinsic radiation risk associated with CT and Radiography. COVID-19 risk was extracted
29 from epidemiological data and analyzed in terms of mortality per age group. Analogously, the ionizing
30 radiation risk was evaluated in terms of mortality per age group considering the Risk Index from Monte
31 Carlo based organ doses, converted to a 5-year relative mortality rate. This risk comparison, by necessity,
32 did not include image quality and individual clinical risk factors. Rather, it was made to fill one necessary
33 gap for consideration and to serve as a complementary analysis to be added to those of diagnostic
34 accuracy and medical intervention. Such an integration could then provide a holistic picture to guide policy
35 makers on the best strategy in managing COVID-19 patients.

41 **4. MATERIALS AND METHODS**

42
43 The study involved assessing and comparing the radiation risk associated with imaging exams to those
44 associated with COVID. The study was performed in compliance with the Health Insurance Portability and
45 Accountability Act and was determined to be exempt from Institutional Review Board requirements.

46
47 For COVID-19 associated risk, this study considered the COVID-19 mortality rate in the epidemiological
48 data across 299,004 patients published by Istituto Superiore di Sanità – Integrated surveillance of COVID-
49 19 in Italy.¹¹ We treated the reported observations as samples from a Bernoulli random variable and used
50 maximum likelihood estimation to calculate the mortality rate in each age group. The associated
51 uncertainties were then evaluated in MATLAB 2019b (Mathworks, Inc.) as binomial confidence intervals
52 (CI) with a 95% significance level.¹²

For radiological risk estimation, this study included 659 Chest CT examinations without contrast performed on adult patients (median age = 62.8 years old; range = [18.1 – 79.9] years old) in US between March 2018 and January 2019 using typical imaging protocols (120 kV tube voltage, 1.53 pitch, 7.6 mGy median CTDI_{vol}, [2.07 – 37.44] mGy CTDI_{vol} range). Patient-specific organ doses (OD) were calculated using an established methodology.¹³ Each patient was matched to a virtual human model from the XCAT phantom library (18-78 years old, 52-117 kg, 23/35 M/F)¹⁴ based on patient lung height and patient diameter (Figure 1). The process included the effect of tube current modulation by first estimating organ doses under constant tube current into CTDI_{vol}-to-organ-dose conversion coefficients (h factors) lookup tables^{13,15,16} using Monte Carlo simulations (PENELOPE, version 2006, Universitat de Barcelona, Spain). To achieve relative errors smaller than 1%, each virtual human model was simulated with 8×10^7 photon histories. Dose spread functions (DSF) were likewise simulated for cylindrical phantoms of different diameters (8 – 50 cm with 2 cm step) at constant mA.¹⁷ Size-specific DSF, normalized to the CTDI and convolved with the TCM, were used to scale the h factors to drive the TCM-specific organ dose values.¹⁷

Following the National Research Council BEIR VII report, organ doses were used to calculate the radiation Risk Index (RI) for each patient as described by Li et al.,^{18,19} using $RI = \sum_T r_T H_T$, where H_T is the equivalent dose for the organ or tissue T and r_T is the gender-, age-, and tissue-specific lifetime attributable risk of cancer incidence reported in BEIR VII.^{18,19} Using the National Cancer Institute Surveillance, Epidemiology, and End Results Cancer Statistics Review 1975-2015 (NCI – SEER),²⁰ the RI was converted to a 5-year relative mortality rate for all cancers. The NCI-SEER data are based on real follow-up of patients into 2015 and the expected survival rates are derived from life tables by socio-economic status, geography, and race developed by the SEER program: its application to the calculated Risk Index enables the estimation of an upper bound for the Chest CT mortality rate.

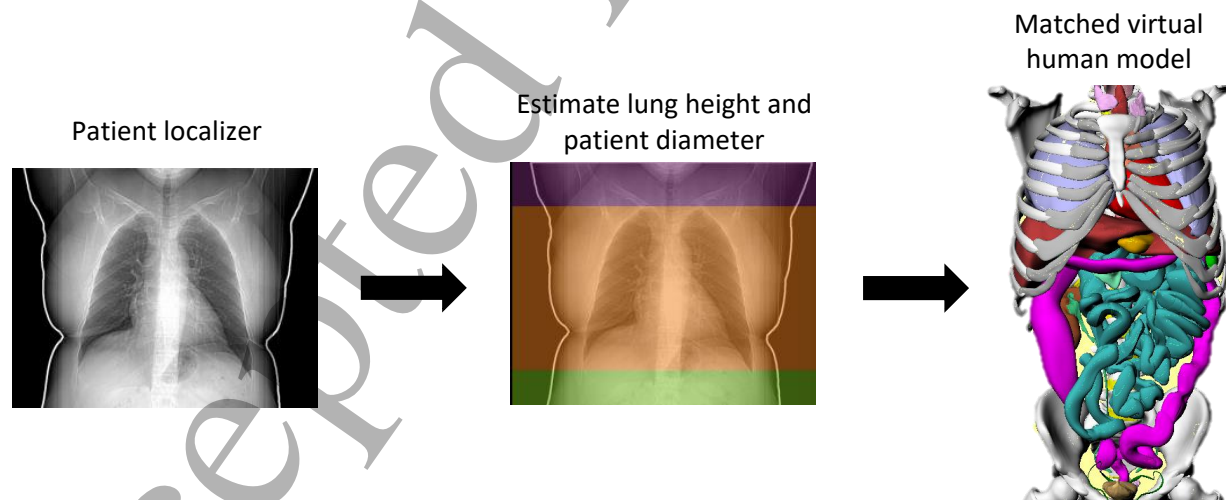


Figure 1. Example of patient matching to a virtual human model.

Radiography mortality was calculated by re-scaling the organ doses estimated in the CT studies following Zhang et al. methodology.²¹ The study estimated organ doses and effective doses for Chest Radiography and Chest CT using a Monte Carlo dose simulation program (PENELOPE, version 2006, Universitat de

Barcelona, Spain) on a total of 59 computational anthropomorphic male and female adult phantoms (extended cardiac-torso, XCAT) and that reported the average lung dose in PA radiography examinations to be about 2% of that in Chest CT.²¹ In particular, the study reported an average lung dose for posteroanterior Chest Radiography of 0.12 mGy (effective dose: 0.04 mSv) and of 5.8 mGy in Chest CT (effective dose: 3.2 mSv). The Radiography organ doses were then used to calculate the Radiography-related radiation Risk Index per each patient and the 5-year relative mortality rate for all cancers as described above, giving an upper bound for the Chest Radiography mortality rate. A schematic of the Chest CT and Chest Radiography mortality estimation method is provided in Figure 2.

The risks associated with Chest Radiography, Chest CT, and COVID-19 were then compared in terms of mortality as a function of age.

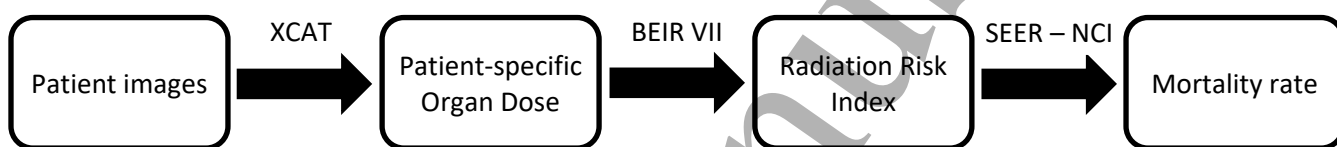


Figure 2. Schematic of radiological procedures risk estimation.

5. RESULTS

Organ doses were calculated for 25 organs in male and 26 organs in female patients.¹⁷ Across all patients, median Lung dose was 15.3 mGy (mean: 16.1 mGy) and ranged between 3.5 mGy and 62.3 mGy. COVID-19 cases per age group, mortality rates per age group, and the related confidence intervals are reported in Table 1. Chest CT and Chest Radiography mortality median and interquartile range per age group are also reported in Table 1 and in Figure 3. The COVID risk factors show strong age dependency. The radiation risks are less varied as a function of age but show a broad spread due to variations in patient size.^{22,23}

Table 1. COVID-19 total number of cases; COVID-19, Chest CT, and Chest Radiography mortality rate per age group. n/a values are related to age groups not included in the patient cohorts.

Age group (years)	COVID-19 cases	Covid-19 Mortality (% across age groups; [95% CI])	CT mortality $\times 10^{-2}$ (%) median; [IQ range]	Radiography mortality $\times 10^{-2}$ (%) median; [IQ range]
0-9	5074	0.10; [0.00 – 0.05]	n/a	n/a
10-19	10261	0.00; [0.00 – 0.02]	0.84; [0.47 – 1.16]	0.03; [0.02 – 0.05]
20-29	27284	0.10; [0.04 – 0.20]	0.86; [0.45 – 1.99]	0.03; [0.02 – 0.08]
30-39	28366	0.20; [0.12 – 0.30]	0.80; [0.33 – 2.04]	0.03; [0.01 – 0.08]
40-49	39857	0.80; [0.68 – 0.93]	1.10; [0.55 – 3.17]	0.04; [0.02 – 0.13]
50-59	51318	2.40; [2.23 – 2.58]	1.01; [0.42 – 1.80]	0.04; [0.02 – 0.07]
60-69	36620	9.80; [9.43 – 10.18]	0.72; [0.33 – 1.28]	0.03; [0.01 – 0.05]
70-79	37016	25.20; [24.67 – 25.74]	0.46; [0.17 – 0.93]	0.02; [0.01 – 0.04]
80-89	43439	33.60; [33.03 – 34.17]	n/a	n/a
>90	19747	33.10; [32.17 – 34.04]	n/a	n/a
Unknown	22	4.5; [1.58 – 10.86]	n/a	n/a
TOTAL	299004	11.90; [11.74 – 12.06]	0.72; [0.33 – 1.35]	0.03; [0.01 – 0.05]

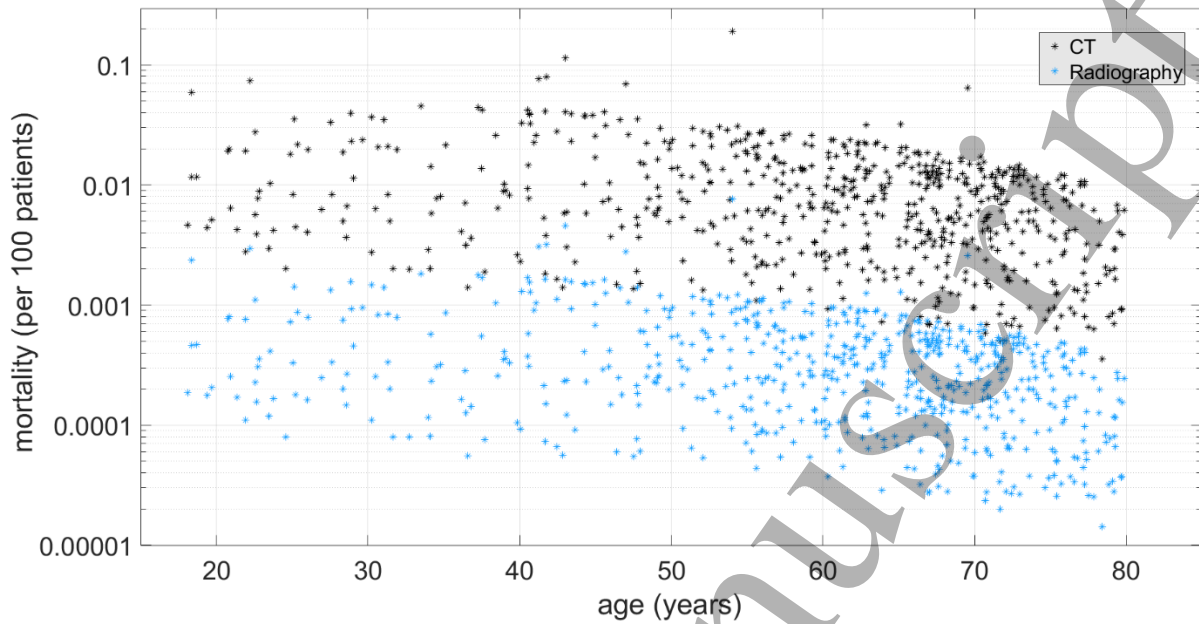


Figure 3. Distribution of Chest CT (black) and Chest Radiography (blue) mortalities per age. Each dot represents a patient undergoing Chest CT or Radiography.

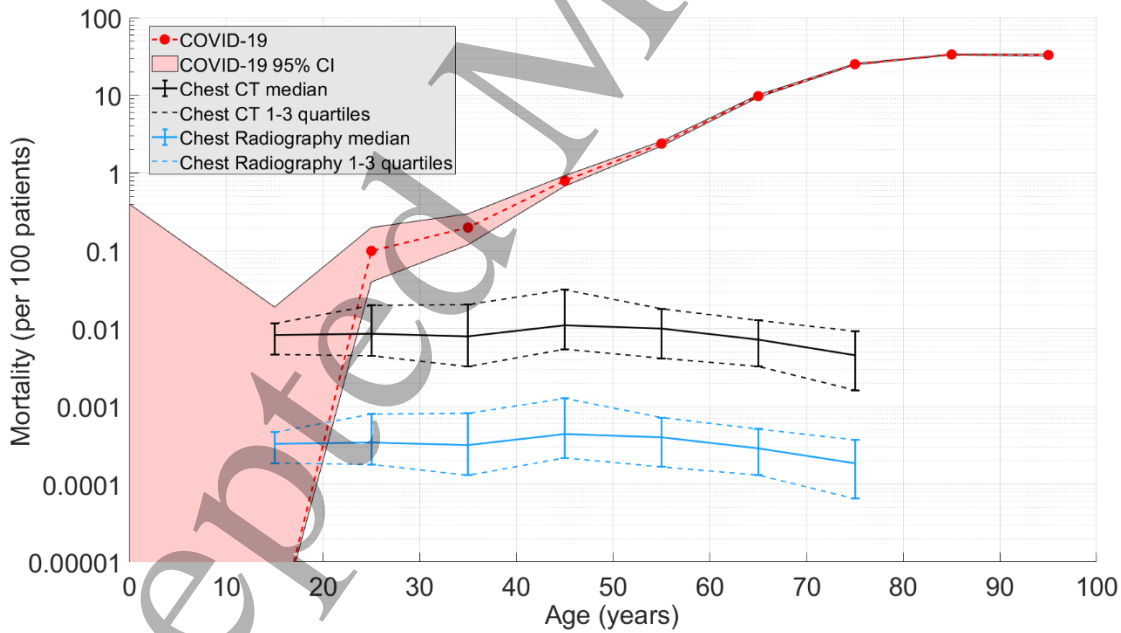


Figure 4. COVID-19 mortality per age (red) compared to those from radiation used in Chest CT (black) and Chest radiography (blue).

Figure 4 shows the three mortality risks. Only 4 deaths due to COVID-19 were reported in Italy across patients between 0 and 19 years old. The risk exhibited a rapid rise between 30 and 89 years old with a

1
2
3 gradual decrease for patients older than 90 years old. Chest CT and Chest Radiography data followed the
4 same trends across age groups with a median Radiography risk magnitude that was 4.3% of the CT risk.
5 CT and Radiography mortality rates showed highest values for the 40-49 years old patients and a gradual
6 decrease for older patients, who are less sensitive to radiation effects. The risk remain largely unchanged
7 for younger patients as the applied protocols are appropriately adjusted based on the Image Gently
8 guidelines. COVID-19 and Chest Radiography risk showed similar values for the 10-19 age group, whereas
9 COVID-19 and Chest CT were comparable for patients between 20 and 30 years old.
10
11
12
13

14 6. DISCUSSION

15
16 This study compared the mortality rate associated with COVID-19 in almost 300,000 patients with an
17 upper bound of mortality for Chest CT and Chest Radiography in adult clinical populations. To our
18 knowledge, such a comparison has not previously been made. The data demonstrates that the risk
19 associated with radiation burden in radiological procedures is low and can be appropriately taken into
20 consideration in using imaging for pandemics. As COVID-19 mortality shows significant differences across
21 age groups, the justification and the choice of the appropriate diagnostic strategy should include patient
22 age considering younger patients that are more sensitive to ionizing radiation.²⁴ In the 20-29-year old
23 age group, COVID-19 mortality is higher than that estimated for Chest Radiography. Between 20 to 29 years
24 old, CT and COVID-19 mortality rates are comparable, with the novel coronavirus risk rising rapidly for
25 patients over 40 years old. Based on risk comparison alone, Chest Radiography and CT for COVID-19 care
26 is justified for patients older than 20 and 30 years old, respectively. With a reported median time of 12
27 days between the onset of symptoms to the death of COVID-19 positive patients²⁵, diagnostic imaging can
28 play a timely response for diagnostic assessment of the disease, as well as the means to assess the extent
29 of the lung involvement for stratified treatments.
30
31
32

33
34 The scientific community already understands that the risks induced by most radiological procedures are
35 small, compared with other lifetime risks from various sources²⁶ and that the risk-to-benefit ratio is
36 favorable when such techniques are used for symptomatic patients, even in the case of CT, the modality
37 with the highest associated radiation burden.²⁷ Despite this consolidate knowledge, seven months after
38 the first reported COVID-19 case, utilizing diagnostic imaging for diagnosis is not unanimously accepted.
39 Few countries (i.e. Italy and China) are using diagnostic imaging,^{5-8,28} whereas others do not.¹⁰ A recent
40 Multinational Consensus Statement from the Fleischner Society evaluated the utility of diagnostic imaging
41 representing different factors.²⁹ We emphasize that radiation burden is obviously not the only factor
42 under scrutiny for determining the role of imaging in COVID-19 care. However, it is an essential factor to
43 be considered. Our observation enables and emphasizes the need to apply optimization principles to
44 define specific imaging protocols that maximize the diagnostic outcome of the exam while keeping its
45 dose in check.³⁰
46
47
48

49
50 Objective optimization in radiology based on the risk-to-benefit ratio requires the quantification of both
51 the diagnostic benefit as well as the disease and radiological risks. Both the benefit and the risk are
52 relevant and important, and ideally assessed in the context of individual patients; e.g., our estimation of
53 radiological risk was made using Monte Carlo methods accounting for individual patient factors of age,
54 sex, and organ radio-sensitivity.^{17,18,31,32} This study focused primarily on the disease and radiological risk.
55 We in fact specifically did not account for diagnostic accuracy, co-morbidities, or other clinical
56 considerations that can strongly affect the individual justification of medical procedures for COVID
57
58
59
60

1
2
3 patients. That is not to imply that those factors are not important. Rather, in this work, we squarely
4 focused on radiation risk in an isolated fashion so that the estimated risk component can be incorporated
5 in follow-up risk-to-benefit analyses. In that way, the outcome of our analysis can provide crucial
6 information to decision and policy makers towards a more patient-centric use of imaging in COVID care.
7

8
9 Some limitations to this study merit discussion. First, the risk was compared in cohorts from two different
10 countries (Italy and US). This was due to the limited availability of the data at this time. However, the
11 reported methodology can be extended to more uniform populations when the new epidemiological data
12 will be available. Second, the conversion from RI to mortality following NCI – SEER data²⁰ did not take into
13 account the timeframe of the risk: COVID-risk is associated with death in the matter of weeks or months
14 while radiation risk is in years and decades. There is currently no method to compare risks that differ in
15 their time horizon. Moreover, there is a large uncertainty in the impact of patient age in the estimation of
16 radiation related risk. Such uncertainties can be mitigated using BEIR VII gender-, age-, and tissue-specific
17 lifetime attributable risk of cancer incidence factors as described in the presented methodology. Such
18 consideration can be applied also if the cancer mortality is calculated applying the conversion factors
19 reported in Table 12D-2 Lifetime Attributable Risk of Cancer Mortality of the BEIR VII report.¹⁸ Third,
20 Radiography organ doses were calculated by re-scaling the organ doses estimated in CT studies based on
21 published data.^{21,33} Fourth, the radiation risk analysis was limited to one scanner model from one vendor.
22 It is known that different vendors pursue different strategies in the management of dose and image
23 quality across clinical populations.^{22,23} However, the differences in dose magnitude are not large enough
24 to affect a population risk study. Lastly, as noted above, this study only focused on radiation risk associated
25 with imaging. Future studies should extend the methodology to include the sensitivity and specificity
26 associated with CT and Radiography towards a more comprehensive risk-to-benefit evaluation.
27
28
29
30

31 **6.1. Conclusions**

32
33 The data reported in this study offer a first approach to risk-to-benefit evaluation in the use of radiological
34 procedures for diagnosis of COVID-19. Because the mortality associated with the pandemic disease and
35 the statistical risk associated with radiological procedures change with patient age and show different
36 trends, the use of CT and Radiography to support the diagnosis of COVID-19 should not be *a priori*
37 excluded. Care should be used in the justification of the best modality, as well as in the optimization of
38 the device parameters considering patient age.
39
40
41
42

43 **7. ACKNOWLEDGEMENT**

44 The authors would like to thank the Editor, the IOP peer-review team, and the Reviewers for their
45 insightful comments and efforts towards improving the manuscript.
46
47
48

49 **8. ETHICAL STATEMENT**

50
51 Institutional Review Board approval was obtained and written informed consent was waived by the
52 Institutional Review Board.
53
54
55
56
57
58
59
60

9. REFERENCES

1. [https://www.who.int/emergencies/diseases/novel-coronavirus-2019/technical-guidance/naming-the-coronavirus-disease-\(covid-2019\)-and-the-virus-that-causes-it](https://www.who.int/emergencies/diseases/novel-coronavirus-2019/technical-guidance/naming-the-coronavirus-disease-(covid-2019)-and-the-virus-that-causes-it), accessed March 26th, 2020.
2. Coronavirus COVID-19 Global Cases by the Center for Systems Science and Engineering (CSSE) at Johns Hopkins University, <https://coronavirus.jhu.edu/map.html>, accessed June 15th, 2020.
3. Center for Disease Control and Prevention. Interim Guidelines for Collecting, Handling, and Testing Clinical Specimens from Persons for Coronavirus Disease 2019 (COVID-19). <https://www.cdc.gov/coronavirus/2019-ncov/lab/guidelines-clinicalspecimens.html>, Accessed Published February 14, 2020. Accessed March 26th, 2020.
4. Y. Yang, M. Yang, C. Shen, F. Wang, J. Yuan, J. Li, et al. Evaluating the accuracy of different respiratory specimens in the laboratory diagnosis and monitoring the viral shedding of 2019-nCoV infections. medRxiv 2020.02.11.20021493; doi: <https://doi.org/10.1101/2020.02.11.20021493>.
5. M. Chung, A. Bernheim, X. Mei, N. Zhang, M. Huang, X. Zeng. CT imaging features of 2019 novel coronavirus (2019-nCoV). Radiology. 2020; 295:202-207.
6. H. X. Bai, B. Hsieh, Z. Xiong, K. Halsy, J. Whae Choi, T. M. Lihn Tran, et al. Performance of radiologists in differentiating COVID-19 from viral pneumonia on chest CT, Radiology, published online March 10th 2020, <https://doi.org/10.1148/radiol.2020200823>.
7. Y. Fang, H. Zhang, J. Xie, M. Lin, L. Ying, P. Pang, W. Ji. Sensitivity of Chest CT for COVID-19: Comparison to RT-PCR. Radiology. Published online February 19th 2020, <https://doi.org/10.1148/radiol.2020200432>.
8. T. Ai, Z. Yang, H. Hou, C. Zhan, C. Chen, W. Lv, et al. Correlation of Chest CT and RT-PCR testing in Coronavirus disease 2019 (COVID-19) in China: a report of 1014 cases. Radiology; published online February 26th 2020, <https://doi.org/10.1148/radiol.2020200642>.
9. Use of chest imaging in COVID-19: a rapid advice guide. Geneva: World Health Organization; 2020 (WHO/2019-nCoV/Clinical/Radiology_imaging/2020.1). Licence: CC BY-NC-SA 3.0 IGO.
10. ACR Recommendations for the use of Chest Radiography and Computed Tomography (CT) for suspected COVID-19 infection. <https://www.acr.org/Advocacy-and-Economics/ACR-Position-Statements/Recommendations-for-Chest-Radiography-and-CT-for-Suspected-COVID19-Infection>, Accessed March 26th, 2020.
11. Task force COVID-19 del Dipartimento Malattie Infettive e Servizio di Informatica, Istituto Superiore di Sanità. Epidemia COVID-19, Aggiornamento nazionale: 18settembre, Accessed September 30th 2020, https://www.epicentro.iss.it/coronavirus/bollettino/Bollettino-sorveglianza-integrata-COVID-19_22-settembre-2020.pdf
12. K. S. Trivedi. Probability and statistic with reliability, queuing, and computer science applications, 2nd edition. New York: Wiley, c2002.
13. X. Tian, W. P. Segars, R. L. Dixon, E. Samei. Convolution-based estimation of organ dose in tube current modulated CT. Physics in medicine and biology. 2016; 61(10):3935-54.
14. W. P. Segars, J. Bond, J. Frush, S. Hon, C. Eckersley, C. H. Williams, et al. Population of anatomically variable 4D XCAT adult phantoms for imaging research and optimization. Medical Physics. 2013; 40(4):043701.
15. P. Sahbaee, W. P. Segars, E. Samei. Patient-based estimation of organ dose for a population of 58 adult patients across 13 protocol categories. Medical Physics. 2014; 41(7):072104-1-12.
16. X. Tian, W. P. Segars, E. K. Paulson, D. P. Frush, E. Samei. Pediatric chest and abdominopelvic CT: organ dose estimation based on 42 patient models. Radiology. 2014; 270:535-547

17. W. Fu, F. Ria, W. P. Segars, K. R. Choudhury, J. M. Wilson, A. Kapadia, E. Samei. Patient-informed organ dose estimation in clinical computed tomography: implementation and effective dose assessment in 1048 patients. *AJR*. 2019, in printing.
18. National Research Council, Health Risks from Exposure to Low Levels of Ionizing Radiation: BEIR VII Phase 2, 2006.
19. X. Li, E. Samei, W. P. Segars, G. M. Sturgeon, et al. Patient-specific radiation dose and cancer risk estimation in CT: Part II. Application to patients. *Medical Physics*. 2011. 38(1):408-419.
20. A. M. Noone, N. Howlander, M. Krapcho, D. Miller, A. Brest, M. Yu, et al. SEER Cancer Statistics Review, 1975-2015, National Cancer Institute. Bethesda, MD, https://seer.cancer.gov/csr/1975_2015/, based on November 2017 SEER data submission, posted to the SEER web site, April 2018.
21. Y. Zhang, X. Li, W. P. Segars, E. Samei. Comparison of patient specific dose metrics between chest radiography, tomosynthesis, and CT for adult patients of wide ranging body habitus. *Medical Physics*. 41(2):0293901-1 – 12.
22. F. Ria, J. T. Davis, J. B. Solomon, J. M. Wilson, T. B. Smith, D. P. Frush, E. Samei. Expanding the concept of Diagnostic Reference Levels to Noise and Dose Reference Levels in CT. *AJR*. 2019; 213:889-894.
23. F. Ria, J. B. Solomon, J. M. Wilson, E. Samei. Technical note: validation of TG 233 phantom methodology to characterize noise and dose in patient CT data. *Medical Physics*. 2020, <https://doi.org/10.1002/mp.14089>.
24. X. Li, E. Samei, W. P. Segars, G. M. Sturgeon, J. G. Colsher, D. P. Frush. Patient-specific radiation dose and cancer risk for pediatric chest CT. *Radiology*. 2011; 259(3): 862-874.
25. Istituto Superiore di Sanità. Characteristics fo SARS-CoV-2 patients dying in Italy report based on available data on July 22nd, 2020. Accessed July 29th. https://www.epicentro.iss.it/en/coronavirus/bollettino/Report-COVID-2019_22_july_2020.pdf
26. C. H. McCollough, L/ Giumaraes, J. G. Fletcher. In defence of body CT. *AJR*. 2009; 193(1):28-39.
27. J. M. Albert. Radiation risk from CT: implications for cancer screening. *AJR*. 2013; 201:W81-W87.
28. A. R. Larici. COVID-19: cosa il medico radiologo deve sapere. *SIRM - Italian Society of Medical and Interventional Radiology*. <https://www.sirm.org/2020/02/28/coronavirus-disease-2019-covid-19-cosa-il-medico-radiologo-deve-sapere/>. Accessed March 28th 2020.
29. G. D. Rubin, L.B. Haramati, J. P. Kanne, N. W. Shluger, J. J. Yim, D. J. Anderson. The role of chest imaging in patient management during the COVID-19 pandemic: a multinational consensus statement from the Fleischner Society. *Radiology*. Published online April 7th 2020, <https://doi.org/10.1148/radiol.2020201365>.
30. A. Dangis, C. Gieraerts, Y. De Bruecker et al. Accuracy and reproducibility of low-dose submillisievert chest CT for the diagnosis of Covid-19. *Cardiothoracic Imaging*. 2020 <https://doi.org/10.1148/ryct.2020200196>.
31. E. Samei, H. Järvinen, M. Kortensniemi, G. Simantirakis, C. Goh, A. Wallace, E. Vano, A. Bejan, M. Rehani, and J. Vassileva. Medical imaging dose optimization from ground up: expert opinion of an international summit. *Journal of Radiological Protection*. 2018; 38:967-989.
32. F. Ria, W. Fu, Y. Zhang, J. Hoyer, P. Segars, A. Kapadia, E. Samei. Characterization of radiation risk across a clinical CT patient population: Comparison across 12 risks metrics. *CIV RSNA Annual Meeting 2018, Chicago (IL) USA*.
33. ACR-AAPM-SPR practice parameter for diagnostic reference levels and achievable doses in medical x-ray imaging, Revised 2018 (Resolution 40).