Evaluating Size-Specific Dose Estimate (SSDE) as an Estimate of Organ Doses from Routine CT Exams Derived from Monte Carlo Simulations

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Running title: SSDE as estimates of Organ Doses

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1 ABSTRACT

2 **Purpose**

The size specific dose estimate (SSDE) is a metric that adjusts $CTDI_{vol}$ to account for patient size. While not intended to be an estimate of organ dose, AAPM Report 204 notes the difference between the patient organ dose and SSDE is expected to be 10-20%. The purpose of this work was therefore to evaluate SSDE against estimates of organ dose obtained using Monte Carlo (MC) simulation techniques applied to routine exams across a wide range of patient sizes.

8

9 Materials and Methods

10 SSDE was evaluated with respect to organ dose based on representative organs for each of three routine 11 protocols: (1) brain parenchyma dose in routine head exams; (2) lung and breast dose in routine chest 12 exams; and (3) liver, kidney, and spleen dose in routine abdomen/pelvis exams. For each exam, voxelized 13 phantom models were created from existing models or derived from clinical patient scans. For routine 14 head exams, 15 patient models were used which consisted of 10 GSF/ICRP voxelized phantom models 15 and 5 pediatric voxelized patient models created from CT image data. For the routine chest exams, data 16 from 161 patients were collected with a D_w range of ~16 to 44 cm. For the routine abdomen/pelvis exams, 17 data from 107 patients were collected with a range of D_w from ~16 to 44 cm. Image data from these 18 patients were segmented to generate voxelized patient models. For routine head exams, fixed tube current 19 (FTC) was used while tube current modulation (TCM) data for body exams were extracted from raw 20 projection data. The voxelized patient models and tube current information were used in detailed MC 21 simulations for organ dose estimation. For all exams, the size metric used was water equivalent diameter 22 (D_w) . Organ doses from MC simulation were normalized by CTDI_{vol} and parameterized as a function of 23 $D_{\rm w}$. For each patient scan, the SSDE was obtained using $D_{\rm w}$ and CTDI_{vol} values of each scan, according to 24 AAPM Report 204 for body scans and Report 293 for head scans. For each protocol and each patient, 25 normalized organ doses were compared to SSDE. A one-sided tolerance limit covering 95% (p = 0.95) of 26 the population with 95% confidence ($\alpha = 0.05$) was used to assess the upper tolerance limit (T_U) between 27 SSDE and normalized organ dose.

28

29 **Results**

For head exams, the T_U between SSDE and brain parenchyma dose was observed to be 12.5%. For routine chest exams, the T_U between SSDE and lung and breast dose was observed to be 35.6% and 68.3%, respectively. For routine abdomen/pelvis exams, the T_U between SSDE and liver, spleen, and kidney dose was observed to be 30.7%, 33.2%, and 33.0%, respectively.

34

35 Conclusions

The T_U of 20% between SSDE and organ dose was found to be insufficient to cover 95% of the sampled population with 95% confidence for all of the organs and protocols investigated, except for brain parenchyma dose. For the routine body exams, excluding the breasts, a wider threshold difference of ~30-36% would be needed for the coverage and confidence investigated in this study.

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41 Keywords: Size-specific dose estimate, Monte Carlo dose simulations, TCM, routine CT exams

42 **1. INTRODUCTION**

CT is widely used as a diagnostic tool due to its ability to acquire cross-sectional images of patient anatomy in a relatively short amount of time. In 2006, abdominal/pelvic, head, and chest CT scans conducted within the United States accounted for 32%, 28%, and 16%, respectively, of all CT procedures [1]. Additionally, the 2015 UC DOSE study found that, across twelve University of California medical centers, abdominal/pelvic, chest, and head scans accounted for 32%, 16%, and 13% of all adult CT procedures [2]. Routine examinations may be reasonably assumed to comprise the large majority of these CT procedures. Thus, patient organ dose assessments from routine procedures are of substantial interest.

50 The volumetric Computed Tomography Dose Index (CTDI_{vol}) and dose-length product (DLP), 51 two commonly-reported CT dose metrics, are understood to not necessarily be indicative of patient 52 dosimetry [3]. This is primarily due to the differences in composition and geometry of the CTDI phantom 53 relative to a human patient. There are at present two ways of estimating patient organ dose from CT: (1) 54 in vitro empirical dose measurements using dosimeters such TLDs or MOSFETs within anthropomorphic 55 phantoms or cadavers and (2) dose calculations from MC software packages.

56 Both of these approaches have inherent advantages and disadvantages in the current context of 57 modern CT dosimetry. In brief, in vitro empirical measurements are advantageous in that dose estimates 58 come directly from the CT source, meaning that specific automatic exposure control (AEC) strategies of 59 manufacturers are captured in these dose readings, provided that the dosimeters are properly calibrated. In addition, this method does allow for repeated exposures. A drawback to physical measurements, 60 61 however, is that oftentimes even the most sophisticated anthropomorphic phantoms models, such as the 62 CIRS phantoms [4] and even cadavers [5], may not have the breadth to be reflective of the range of actual 63 patient anatomy experienced clinically. In vivo measurements can be done, such as in the study where 64 TLDs were placed in the colon and used for CT colonography dosimetry [6]. However, in vivo 65 measurements are often invasive. Moreover, the dose distribution within the patient is not necessarily 66 uniform, particularly near the surface of a patient [7]. Therefore, adequate spatial sampling of the non-67 uniform distribution to obtain an estimate of organ dose may require a large number of dosimeters.

68 MC approaches address some of the shortcomings of the in vitro, empirical methods. MC 69 methods obviate the need for dosimeters entirely due to the mathematical transportation of particles 70 through a particular medium. Moreover, the availability of highly-sophisticated, deformable, 71 mathematical phantoms models, such the XCAT family models [8], allows for permutations of human 72 anatomy. Commercially-available dose management software packages, used widely in hospitals and 73 medical centers, often employ MC simulations based on these sophisticated, mathematical models of 74 human anatomy. However, this approach comes with its own set of challenges. As with any MC 75 simulation, the accuracy of the MC approach is highly dependent upon the accuracy of the simulation set 76 up [9], [10]. For CT dosimetry, this accuracy requires both sufficient scanner x-ray source descriptions 77 and accurate representations of both vendor-specific AEC algorithms and patient anatomic 78 representations. Furthermore, MC methods require extensive validation, usually with equivalent empirical 79 measurements, and can be time prohibitive and computationally expensive.

80 While not originally intended to be a measure of organ dose, SSDE does have the potential to 81 provide an accessible and quick estimate of organ dose in lieu of empirical measurement and MC 82 approaches. Per Report 204, SSDE was based on fixed tube current (FTC) [11], [12]. A study conducted 83 by Moore et al. investigated the correlation between absolute organ dose from TCM scans with SSDE in 84 pediatric and adult patients using in vitro organ dose measurements from four CIRS anthropomorphic 85 phantoms [13]. This study used effective diameter (ED) as the metric of patient and phantom size and 86 compared patient organ dose derived from SSDE-to-organ dose conversion coefficients to published MC 87 results of computational phantoms. The Moore et al. study found that the average correlation of SSDE 88 and absolute organ dose was found to be within $\pm 10\%$ of unity [13]. Another study conducted by Sinclair 89 et al. compared correlations of CTDI_{vol}-normalized organ dose versus ED against SSDE for 90 chest/abdomen/pelvis exams [14]. In this study, the organ dose values were from in vitro measurements 91 of 8 cadavers representing a range of sizes from the University of Florida. In this study, the difference 92 between the average overall organ dose measurements from the cadavers and SSDE ranged from -23% to 93 4% [14]. In both these studies, ED was used as the metric of patient size, whereas the attenuation-based

size metric water equivalent diameter (D_w) is now more commonly used [15]. Moreover, the Moore et al. study indirectly compared SSDE to empirical measurements and MC simulations of hybrid computational phantom models from Lee et al. and Li et al. [16], [17]. As mentioned above, the use of in vitro measurements from detailed physical phantoms and MC simulations of the highly-sophisticated computational phantom may not be representative of variation of patient habitus.

99 Therefore, the purpose of this study was to evaluate SSDE as an estimate of organ doses derived 100 from the MC simulation of routine exams. In contrast to the previous studies, this evaluation of SSDE 101 was performed on a direct, per-organ basis across a wide range of patient habitus for routine head, chest, 102 and abdomen/pelvis exams. Specifically, this study evaluated the SSDE in relation to brain parenchyma 103 dose from routine head exams; lung and breast dose from routine chest exams; and liver, spleen, and 104 kidney dose from routine abdomen/pelvis exams.

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2. MATERIALS AND METHODS

107 2.A Voxelized patient cohorts

108 2.A.1 Routine Head Exams

109 The patient data for the routine head exams was from Hardy et al [18]. This data consists of a 110 total of 15 voxelized patient models. Ten voxelized phantom models from the GSF (Helmholtz Zentrum 111 München, German Research Center for Environment Health, Institute of Radiation Protection, 112 Neuherberg, Germany) family [19] and the ICRP (International Commission Radiological Protection) 113 voxelized reference male and female [20], [21] were used. These models had all radiosensitive organs 114 identified. The eight GSF voxel-based models were generated from CT images with up to 131 organs and 115 anatomic structures segmented. Two of the voxelized models were the ICRP reference male and female 116 models. They were each based on modifications of two corresponding male and female GSF models of 117 similar external dimensions. The GSF/ICRP voxelized models used in this study had the in-plane 118 resolution subsampled from the original by approximately a factor of four or eight to decrease 119 computation time [19]–[21]. The remaining five patient models were derived from pediatric patient data 120 in order to extend the pediatric size range. These data sets were collected from clinically-indicated scans

121 under IRB approval.

122 The routine head protocols were performed with FTC. The details of the protocol are listed in 123 **Table 1**. Because the analyses will be performed on a per mAs basis, the $CTDI_{vol,16}$ /mAs value is 124 reported.

 125
 Table 1: Routine helical head scanning protocol and associated CTDI_{vol,16} per mAs for the scan from

 126
 Hardy et al [18]

| Parameter | Setting |
|---------------------------------------|----------|
| kV | 120 |
| Rotation time (s) | 0.5 |
| Helical pitch | 0.55 |
| Nominal collimation (mm) | 28.8 |
| Bowtie filter | Standard |
| CTDI _{vol,16} /mAs (mGy/mAs) | 0.24 |

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128 2.A.2 Routine Chest Exams Patient Cohort

129 To estimate lung and glandular breast tissue dose from routine chest exams, data were collected 130 under IRB approval from 161 patients undergoing clinically indicated CT exams (19 pediatric females, 23 131 pediatric males, 53 adult females, 65 adult males) with a range of D_w values from 16 to 44 cm. The 132 routine chest examinations were performed using tube current modulation (TCM). Data were collected 133 from four different scanners: Sensation 16 (S16), Sensation 64 (S64), Definition AS64, and SOMATOM 134 Force (all from Siemens Healthineers, Forchheim, Germany). Table 2 summarizes the scanning protocols 135 for the routine chest protocols used for the four scanners. Because of the presence of pediatric and 136 bariatric patients, some alterations of the routine chest protocol-such as reduced tube voltage for 137 pediatric patients, reduced pitch for bariatric patients ($D_w \approx 40$ or greater), and different bowtie filters for 138 pediatric patients—were present in this cohort. All scans were performed with TCM (CAREDose4D, 139 Siemens Healthineers, Germany) with the CAREDose4D Quality Reference mAs (QRM) value as 140 described in Table 2 and strength set to "Average." For all cases, the TCM data was extracted from the

141 raw projection data that was collected at the time of the scan. The chest scans were all performed in the 142 supine position. Image data were reconstructed at 500 mm field-of-view (FOV) in order to ensure patient 143 anatomy is contained within the FOV. For bariatric patients, portions of peripheral anatomy were often 144 still outside of the 500 mm FOV. In these cases, an extended FOV (eFOV) of 650 mm was employed to 145 encompass the anatomy for larger patients. **Table 3** summarizes the quantity of patient data from each 146 scanner.

| Table 2: | Routine che | st scanning | parameters | for the f | our scanners | used in | this inv | <i>vestigation</i> |
|----------|-------------|---------------------------------------|------------|-----------|--------------|---------|----------|--------------------|
| | | · · · · · · · · · · · · · · · · · · · | | | | | | |

| Parameter | S16 | S64 | AS64 | Force |
|-----------------------------|------|------|---------|---------|
| kV^* | 100 | 120 | 120 | 120 |
| Quality reference mAs (QRM) | 140 | 140 | 140 | 140 |
| Rotation time (s) | 0.5 | 0.5 | 0.5 | 0.5 |
| $Pitch^\dagger$ | 1.0 | 1.0 | 1.0 | 1.0 |
| Nominal collimation (mm) | 24.0 | 19.2 | 19.2 | 57.6 |
| Bowtie filter [‡] | Body | Body | Body/W1 | Body/W1 |

149 * Most of the pediatric patients were scanned with 100 kV.

Adult females

Pediatric males

Pediatric females

Total

150 [†]Bariatric patients were scanned with pitches lower than 1.0

151 ‡For the AS64 and Force scanners, the pediatric patients were scanned with Head/W2 bowtie filter

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| | Table3: Overview of | of chest scans of | collected from t | he different s | canners used i | in this study |
|---|---------------------|-------------------|------------------|----------------|----------------|---------------|
| | Patient cohort | S16 | S64 | AS64 | Force | Total |
| - | Adult males | - | 42 | 12 | 11 | 65 |

| 155 | To use the patient image data for MC simulations, patient anatomy contained within the image |
|-----|--|
| 156 | data were voxelized. Voxels within the image data were modeled as either lung, fat, water, muscle, bone |
| 157 | or air then subdivided into one of seventeen density levels in relation to their CT number [22], [23]. The |
| 158 | lung tissue was semi-automatically contoured in both female and male patients; glandular breast tissue, |
| 159 | however, was only segmented for female patients [24]. Figure 1 contains examples of segmented male |
| 160 | and female patient image data and resulting voxelized models. |





Figure 1: A) Segmented images of a male patient who underwent clinically-indicated chest CT exam with **B**) the voxelization of the segmented image data for use in MC simulations. In **A**), only the lung tissue (red outline) is segmented. **C**) Segmented images of a female patient who underwent clinicallyindicated chest CT exam with **D**) the voxelization of the segmented image data for use in MC simulations. In **C**), both lung (red outline) and glandular breast tissue (yellow outline) are segmented.

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169 2.A.3 Routine Abdominal/Pelvic Exams

170 To estimate liver, spleen, and kidney dose from routine abdomen/pelvis exams, data were 171 collected under IRB approval from 107 patients undergoing clinically indicated CT exams (9 pediatric 172 females, 12 pediatric males, 44 adult females, 42 adult males) with a range of D_w values from 16 to 44 173 cm. The routine abdomen/pelvis examinations were performed using TCM. Data were collected from 174 three different scanners: Sensation 64 (S64), Definition AS64, and SOMATOM Force (all from Siemens 175 Healthineers, Forchheim, Germany). As with the routine chest protocol in Sec. 2.A.2, some alterations of 176 the routine abdomen/pelvis protocol were present in this cohort because of the presence of pediatric and 177 bariatric patients (again, defined as $D_w \approx 40$ or greater). All scans were performed with TCM 178 (CAREDose4D, Siemens Healthineers, Germany) with the QRM value as described in Table 4 and 179 strength set to "Average." For call cases, the TCM data was extracted from the raw projection data that 180 was collected at the time of the scan. Table 4 contains the remaining scanning parameter for the 181 abdomen/pelvis protocols for the three scanners of this investigation. All of the abdomen/pelvis scans 182 were performed in the supine position, and the image data were reconstructed at 500 mm field-of-view 183 (FOV) in order to ensure patient anatomy is contained within the FOV. An extended FOV (eFOV) of 650 184 mm was utilized to encompass the anatomy for bariatric patients. Table 5 summarizes the quantity of 185 patient data from each scanner. The abdominal/pelvic image data were voxelized for utilization in MC 186 simulations in the same manner as Sec 2.A.2 above. Figure 2 contains examples of segmented female 187 patient image data and resulting voxelized models.

188

189 **Table 4:** Routine abdominal/pelvis scanning parameters for the three scanners used in this investigation

| | Parameter | | S64 | AS64 | Force |
|--|--|--|--|--|---|
| | kV* | | 120 | 120 | 120 |
| | Quality reference mA | as (QRM) | 180 | 180 | 180 |
| | Rotation time | (s) | 0.5 | 0.5 | 0.5 |
| | Pitch [†] | | 1.0 | 1.0 | 1.0 |
| | Nominal collimatio | on (mm) | 19.2 | 19.2 | 57.6 |
| | Bowtie filter | .‡ | Body | Body/W1 | Body/W1 |
| .90 | * Most of the pec | liatric patien | ts were sca | nned with 10 |) kVp. |
| 91 | *Bariatric patient | ts were scan | ned with ni | tches lower th | an 10 |
| | Duriunie putient | to mere beam | nee min pi | | |
| 92 ‡For th | e AS64 and Force scanners, t | he pediatric | patients we | ere scanned w | ith Head/W2 bo |
| 92 ‡For th | e AS64 and Force scanners, t | he pediatric | patients we | ere scanned w | ith Head/W2 bo |
| .92 ‡For th | e AS64 and Force scanners, t | he pediatric | patients we | ere scanned w | ith Head/W2 bo |
| 92 ‡For th 93 94 Table 5: A | e AS64 and Force scanners, t n overview of abdomen/pelvi | he pediatric | patients we | ere scanned w the different s | ith Head/W2 bo scanners used in |
| 92 ‡For th 93 94 Table 5: A | e AS64 and Force scanners, t n overview of abdomen/pelvi Patient cohort | he pediatric is scans colle S64 | patients we ected from AS64 | ere scanned w the different s Force | ith Head/W2 bo scanners used in Total |
| 92 ‡For th 93 94 Table 5: A | e AS64 and Force scanners, t n overview of abdomen/pelvi Patient cohort Adult males | he pediatric is scans colle <u>S64</u> 30 | patients we ected from AS64 8 | ere scanned w the different s Force 4 | ith Head/W2 bo scanners used in Total 42 |
| 92 ‡For th 93 94 Table 5: A | e AS64 and Force scanners, t n overview of abdomen/pelvi Patient cohort Adult males Adult females | he pediatric is scans colle <u>S64</u> 30 32 | patients we ected from AS64 8 7 | the different s Force 4 5 | ith Head/W2 bo scanners used in Total 42 44 |
| 92 ‡For th 93 94 Table 5: A | e AS64 and Force scanners, t n overview of abdomen/pelvi Patient cohort Adult males Adult females Pediatric males | he pediatric is scans colle <u>S64</u> 30 32 11 | patients we ected from AS64 8 7 - | the different s Force 4 5 1 | ith Head/W2 bo scanners used in Total 42 44 12 |
| 92 ‡For th 93 94 Table 5: A | e AS64 and Force scanners, t n overview of abdomen/pelvi Patient cohort Adult males Adult females Pediatric males Pediatric females | he pediatric is scans colle S64 30 32 11 9 | patients we ected from AS64 8 7 - - | the different s Force 4 5 1 0 | ith Head/W2 bo scanners used in Total 42 44 12 9 |
| 92 ‡For th 93 94 Table 5: A | e AS64 and Force scanners, t n overview of abdomen/pelvi Patient cohort Adult males Adult females Pediatric males Pediatric females Total | he pediatric is scans colle 364 30 32 11 9 82 | patients we ected from AS64 8 7 - - - 15 | the different s Force 4 5 1 0 10 | ith Head/W2 bo scanners used in Total 42 44 12 9 107 |



Figure 2: A) Segmented images of a female patient who underwent clinically-indicated abdomen/pelvis
CT exam with B) the voxelization of the segmented image data for use in MC simulations.

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201 **2.B. Patient size metrics**

202 Water equivalent diameter (D_w) was chosen as the metric of patient for this investigation. AAPM 203 Report 220 describes two methods of estimating D_w : one based on values extracted from the topogram 204 and one based on CT image data [15]. For this study, both approaches were used, depending on the data 205 available. For those patients whose data was collected on either the Sensation 16 or the Sensation 64 206 scanners, estimates of D_w were based on the CT numbers in the image data. This was done because the 207 CT scan radiographs (i.e. topograms) for these patients were not available. Specifically, D_w was 208 estimated at the center of the image series using the methods outlined in AAPM Report 220 for assessing D_w from CT numbers in image data [25]. For the patients whose data was gathered from the Definition 209 210 AS64 or the Force scanners, estimates of D_w were extracted from the topogram. For each patient model, 211 D_w was assessed at the longitudinal center of the image series while the estimates of D_w were obtained 212 from the topogram at that center location. This method of acquiring D_{w} from the topogram is also based 213 on the methodology outline in AAPM Report 220 wherein D_w is calculated using the lateral (LAT) and 214 anterior-posterior (AP) measurements also found within the topogram [25].

215

216 **2.C. MC simulations**

217 The MC simulation package used for this study was MCNPX. Modifications to MCNPX allowed for the implementation of "equivalent source" and "equivalent bowtie" of the four MDCT scanners used 218 219 in this investigation [26]. All simulations were performed in photon transport mode with a 1 keV low-220 energy cut-off. All simulations were performed with 10^7 particle histories to ensure a statistical 221 uncertainty of less than 1%. In order to incorporate the TCM data into the MC simulation, the methods 222 described by Angel et al. were used in that an additional text file containing the TCM information was 223 generated by extracting the tube current information from the raw projection data [24]. In the text file, the 224 tube current $I(z,\Theta)$ was expressed as a function of table position (z) and tube angle (Θ). MCNPX 225 simulations were performed using the computational and storage services associated with the Hoffman2 226 Shared Cluster provided by UCLA Institute for Digital Research and Education's Research Technology 227 Group.

228

229 2.D Dose Analysis

230 Absolute organ dose values were estimated from MC simulations by applying scanner-, tube 231 voltage-, collimation-specific normalization factors [27]. CTDIvol-normalized organ dose values (nDorgan) 232 from the routine exams investigated were calculated by normalizing the absolute organ doses by CTDI_{vol} 233 values. CTDI_{vol}-normalized brain parenchyma dose values (nD_{brain}) from routine head exams were 234 calculated using $\text{CTDI}_{\text{vol},16}$. CTDI_{vol} -normalized lung and breast dose values (nD_{lung} and nD_{breast}) were 235 calculated using CTDI_{vol,32} for normalization. Similarly, CTDI_{vol,32} was used to normalize liver, kidney, 236 and spleen dose values (nD_{liver} , nD_{kidney} , and nD_{spleen} , respectively). All CTDI_{vol} values were taken from the 237 patient protocol page produced by the scanners utilized in this investigation. Lastly, each nD_{organ} was 238 parameterized as an exponential function with respect to D_w using the same form as AAPM Report 204. 239 Regression analyses were used to determine the coefficients of the exponential function for each scan 240 protocol and organ.

241

242 **2.E Statistical Analysis**

 nD_{organ} values from the routine exams were compared to SSDE *f*-factors (henceforth referred to as 243 SSDE). This study used the SSDE from AAPM Report 293 for head exams and AAPM 204 for body 244 exams as the basis of comparison [11], [12]. For an individual patient, $\Delta D_{SSDE,organ}$ is the nD_{organ} value 245 246 relative to the SSDE value based on the patient's D_w estimate. This was calculated for each patient, for 247 each protocol, and for each organ. The definition of $\Delta D_{SSDE,organ}$ for a given patient *i* is given by Eq. 1: 248

$$(\Delta D_{SSDE,organ})_i \ (\%) = \frac{(nD_{organ})_i - SSDE(D_w)_i}{SSDE(D_w)_i} \times 100\%$$
 Eq. 1

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250

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255

For each organ dose from each protocol, the average difference relative to SSDE ($\overline{\Delta D_{SSDE.organ}}$), 251 and the standard deviation of the difference relative to SSDE ($\Delta S_{SSDE,organ}$) were calculated using Eq. 2 252 253 and Eq. 3, respectively.

$$\overline{\Delta D_{SSDE,organ}} \ (\%) = \frac{1}{N} \sum_{i=1}^{N} |(\Delta D_{SSDE,organ})_i|$$
Eq. 2

$$\Delta S_{SSDE,organ} (\%) = \sqrt{\frac{1}{N-1} \sum_{i=1}^{N} \left(|(\Delta D_{SSDE,organ})_i| - \overline{\Delta D_{SSDE,organ}} \right)^2}$$
 Eq. 3

256 Where *N* is the total number of patients.

257 A second analysis was performed to assess the number of cases where the estimated organ doses 258 agreed with SSDE values to within a certain tolerance (either \pm 20% and \pm 30% of the SSDE). In the plots 259 found in Sec. 3 below, this is graphically illustrated by using shaded regions that correspond to $\pm 20\%$ and 260 \pm 30% of the SSDE. The proportion of the data points within these regions (C_p) were given for each organ 261 and was calculated using Eq. 4.

262
$$C_p = \frac{\# \text{ of points within the regions relative to SSDE}}{N}$$
 Eq.4

263 Lastly, in order to determine the coverage of SSDE as an estimate of organ dose over a fixed proportion 264 of the population, a one-sided, upper tolerance limit was calculated. The one-sided tolerance limit was 265 utilized because this study is concerned with assessing the upper tolerance limit (T_U) of the difference 266 between normalized organ dose and the SSDE values. The coverage factor (proportion of the population 267 of nD_{organ} values, p) used to construct the tolerance limit was 95% (p = 0.95) with a confidence level of 268 95% ($\alpha = 0.05$). Using the upper bound of 20% difference between SSDE and patient dose mentioned in 269 AAPM Report 204 as a point of comparison, the hypotheses for this study were as follows:

- 1) <u>Null hypothesis (H_0)</u>: $T_U \le 20\%$ with a confidence of 95% ($\alpha = 0.05$) covering 95% of the population (p = 0.95).
- 272 2) <u>Alternative hypothesis (H_I)</u>: $T_U > 20\%$ with a confidence of 95% ($\alpha = 0.05$) covering 95% of the 273 population (p = 0.95).
- 274 Where T_U is calculated as

275
$$T_U = \overline{\Delta D_{SSDE,organ}} + k_1(\alpha, p, N) \Delta S_{SSDE,organ}$$
 Eq. 5

Where is k_1 is the factor that determines the upper limit to cover proportion p with confidence (1-a)% using sample size N [28]. The upper tolerance limit of 30% difference between SSDE and patient dose can be derived analogously. **Figure 3** is the process workflow for evaluating SSDE against organ dose.



281 Figure 3: The workflow process for this study in the instances where raw projection data was needed. 282 Starting with (I) raw projection data as input, (II) image data were reconstructed and segmented. (III) 283 Tube current profiles was extracted from the raw data. (IV) The segmented image data was voxelized by 284 mapping CT number to a material designation using a look-up table. The TCM data (III) and the 285 voxelized patient model (IV) were incorporated into MCNPX to get (V) absolute organ doses. Absolute 286 organ doses (V) were normalized by (VI) CTDI_{vol} from the patient protocol page to yield (VII) CTDI_{vol}-287 normalized organ doses. (VIII) From the topogram, estimates of D_w (IX) were then extracted. In this 288 workflow, D_w estimates can also be taken from the image data. The D_w estimates were used to calculate the SSDE (X) from AAPM Reports 204 and 220. Lastly SSDE was then evaluated (XI) relative to MC-289 290 derived CTDI_{vol}-normalized organ doses. Where raw projection data was not needed, such as for the 291 routine head scans, I and III were skipped and CTDI_{vol,16}/mAs measurement was used in lieu of VI. 292

3. RESULTS

294 3.A SSDE relative to brain parenchyma dose from routine head exams

Table 6 below contains the D_w estimates, SSDE from AAPM Report 293, nD_{brain} values, and difference (%) of nD_{brain} values relative to the SSDE ($\Delta D_{SSDE,brain}$). In addition, the mean ($\overline{\Delta D_{SSDE,brain}}$) and standard deviation of brain dose relative to SSDE($\Delta S_{SSDE,brain}$) are also included in **Table 6**. The patient population did include both pediatric and adult patients with a range of D_w from ~11 to 20 cm. $\Delta D_{SSDE,brain}$ values ranged from -5.9% to 13.8%. $\overline{\Delta D_{SSDE,brain}}$ was observed to be 4.4% and $\Delta S_{SSDE,brain}$ was observed to be 3.2%. All 15 nD_{brain} values were within 20% of SSDE ($C_p = 100.0\%$). Using N = 15, T_U for SSDE covering 95% of the population for nD_{brain} with 95% confidence was observed to be 12.5%.

Figure 4 shows below nD_{brain} parameterized as an exponential function with D_w in relation to SSDE

values from AAPM Report 293.

| 305 | Table 6: D_w estimates, SSDE, nD_{brain} values, and difference of nD_{brain} values relation | ve to | the SSDE |
|-----|--|-------|----------|
| 306 | $(\Delta D_{SSDE, brain})$ for the patients investigated | | |

| Name | D_w (cm) | SSDE | nD_{brain} | $\Delta D_{SSDE, brain}$ (%) |
|---------------|------------|------|-------------------------------------|------------------------------|
| Peds2 | 12.6 | 1.07 | 1.12 | -4.8 |
| Peds1 | 10.6 | 1.19 | 1.17 | 1.4 |
| Baby | 11.1 | 1.16 | 1.16 | -0.7 |
| Peds3 | 15.6 | 0.93 | 0.98 | -5.3 |
| Peds5 | 17.1 | 0.86 | 0.81 | 5.5 |
| Peds4 | 15.7 | 0.92 | 0.89 | 3.5 |
| Child | 17.2 | 0.86 | 0.91 | -6.2 |
| Helga | 18.2 | 0.82 | 0.81 | 0.4 |
| Irene | 17.1 | 0.86 | 0.84 | 2.4 |
| Golem | 18.3 | 0.81 | 0.86 | 5.5 |
| Visible Human | 19.6 | 0.76 | 0.74 | 2.3 |
| Regina | 19.9 | 0.75 | 0.85 | -13.8 |
| Donna | 18.7 | 0.79 | 0.83 | 5.0 |
| Rex | 20.2 | 0.74 | 0.78 | 5.4 |
| Frank | 19.2 | 0.78 | 0.73 | 5.9 |
| | | | $\overline{\Delta D_{SSDE, brain}}$ | 4.4 |
| | | | $\Delta S_{SSDE, brain}$ | 3.2 |
| | | | T_U | 12.5 |



310 **Figure 4:** nD_{brain} values in relation to SSDE from AAPM Report 293 with shaded areas corresponding to $\pm 20\%$ and $\pm 30\%$ of the SSDE

313 3.B SSDE relative to lung and breast dose from routine chest exams

Figure 5A contains nD_{lung} parameterized as an exponential function with D_w in relation to SSDE from AAPM Report 204. For nD_{lung} , $\Delta D_{SSDE,lung}$ values ranged from -60.4% to 20.1%. $\overline{\Delta D_{SSDE,lung}}$ was observed to be 15.3% and $\Delta S_{SSDE,lung}$ was observed to be 10.9%. Of the 160 cases, 119 of the nD_{lung} values were within 20% of SSDE ($C_p = 74.4\%$) while 148 of the nD_{lung} values were within 30% of SSDE ($C_p =$ 92.5%). Only 12 of the nD_{lung} cases were beyond 30% of SSDE ($C_p = 7.5\%$). Using N = 160, T_U for SSDE covering 95% of the population for nD_{lung} with 95% confidence was observed to be 35.6%.

320 **Figure 5B** shows nD_{breast} parameterized as an exponential function with D_w in relation to SSDE. 321 For nD_{breast} , $\Delta D_{SSDE, breast}$ values ranged from -90.8% to 10.4%. $\overline{\Delta D_{SSDE, breast}}$ was observed to be 31.8% and 322 $\Delta S_{SSDE, breast}$ was observed to be 18.7%. Of the 85 cases, 26 of the *nD*_{breast} values were within 20% of SSDE 323 $(C_p = 30.6\%)$ while 44 of the nD_{breast} values were within 30% of SSDE $(C_p = 51.8\%)$. 41 of the nD_{breast} 324 cases were beyond 30% of SSDE ($C_p = 48.2\%$). Using N = 85, T_U for SSDE covering 95% of the 325 population for nD_{breast} with 95% confidence was observed to be 60.7%. Table 7 contains the summary 326 statistics for nD_{lung} and nD_{breast} values relative to the SSDE and the T_U for each organ. Table 10 contains 327 the frequency table for nD_{lung} and nD_{breast} values relative to 20% and 30% of the SSDE.





Figure 5: A) nD_{lung} and B) nD_{breast} values in relation to SSDE from AAPM Report 204 with shaded areas corresponding to \pm 20% and \pm 30% of the SSDE

Table 7: Summary statistics for nD_{lung} and nD_{breast} values relative to SSDE and the T_U for each estimate of normalized lung dose

| | nD_{lung} | <i>nD</i> _{breast} |
|--|---------------|-----------------------------|
| $\Delta D_{SSDE,organ}$ range (%) | -60.4 to 20.1 | -90.8 to 10.4 |
| $\overline{\Delta D_{SSDE,organ}}$ (%) | 15.3 | 31.8 |
| $\Delta S_{SSDE,organ}$ (%) | 10.9 | 18.7 |
| $T_U(\%)$ | 35.6 | 68.3 |

334

Table 8: Frequency table of nD_{lung} and nD_{breast} relative to SSDE from routine TCM chest exams

| | nD_{lung} (N=160) | nD _{breast} (N=85) |
|---------------------------|------------------------|--------------------------------|
| within $\pm 20\%$ of SSDE | 119 $C_p = 74.4\%$ | $26 C_p = 30.6\%$ |
| within \pm 30% of SSDE | 148 $C_p = 92.5\%$ | $44 C_p = 51.8\%$ |
| beyond \pm 30% of SSDE | $12 C_p = 7.5\%$ | $41 C_p = 48.2\%$ |

336

337 3.C SSDE relative to liver, spleen, and kidney dose from routine abdominal/pelvis exams

Figure 6A contains nD_{liver} parameterized as an exponential function with D_w in relation to SSDE from AAPM Report 204. $\Delta D_{SSDE,liver}$ values ranged from -54.0% to 28.7%. $\overline{\Delta D_{SSDE,liver}}$ was observed to be 13.1% and $\Delta S_{SSDE,liver}$ was observed to be 9.2%. Of the 107 cases, 88 of the nD_{liver} values were within 20% of SSDE ($C_p = 82.2\%$) while 104 of the nD_{liver} values were within 30% of the SSDE ($C_p = 97.2\%$). Only 3 of the nD_{liver} cases were beyond 30% of SSDE ($C_p = 2.8\%$). Using N = 107, T_U for SSDE covering 95% of the population for nD_{liver} with 95% confidence was observed to be 30.7%.

Figure 6B contains nD_{spleen} parameterized as an exponential function with D_w in relation to SSDE from AAPM Report 204. $\Delta D_{SSDE,spleen}$ values ranged from -44.4% to 35.4%. $\overline{\Delta D_{SSDE,spleen}}$ was observed to be 14.1% and $\Delta S_{SSDE,spleen}$ was observed to be 10.0%. Of the 107 cases, 81 of the nD_{spleen} values were within 20% of SSDE ($C_p = 75.7\%$) while 99 of the nD_{spleen} values were within 30% of SSDE ($C_p =$ 92.5%). Only 8 of the nD_{spleen} cases were beyond 30% of SSDE ($C_p = 7.5\%$). T_U for SSDE covering 95% of the population for nD_{spleen} with 95% confidence was observed to be 33.2%. 350 Figure 6C contains nD_{kidney} parameterized as an exponential function with D_w in relation to SSDE 351 from AAPM Report 204. $\Delta D_{SSDE,kidney}$ values ranged from -49.6% to 47.3%. $\overline{\Delta D_{SSDE,kidney}}$ was observed to 352 be 13.7% and $\Delta S_{SSDE,kidney}$ was observed to be 10.1%. Of the 107 cases, 83 of the nD_{kidney} values were 353 within 20% of SSDE ($C_p = 77.6\%$) while 100 of the nD_{kidney} values were within 30% of the SSDE ($C_p =$ 354 93.5%). Only 7 of the nD_{kidney} cases were beyond 30% of SSDE ($C_p = 6.5\%$). T_U for the SSDE covering 355 95% of the population for nD_{kidney} with 95% confidence was observed to be 33.0%. Table 9 contains the 356 summary statistics for nD_{liver} , nD_{spleen} , and nD_{kidney} values relative to the SSDE and the T_U for each organ. 357 Table 10 contains the frequency table for nD_{liver} , nD_{spleen} , and nD_{kidney} values relative to 20% and 30% of 358 SSDE.

359



Figure 6: A) nD_{liver}, B) nD_{spleen}, and C) nD_{kidney} values in relation to SSDE from AAPM Report 204 with 362 shaded areas corresponding to \pm 20% and \pm 30% of the SSDE

364 **Table 9:** Summary statistics for nD_{liver} , nD_{spleen} , and nD_{kidney} values relative to SSDE and the T_U for each organ for TCM abdomen/pelvis exams

| | nD_{liver} | nD_{spleen} | nD_{kidney} |
|--|---------------|---------------|---------------|
| $\Delta D_{SSDE,organ}$ range (%) | -54.0 to 28.7 | -44.4 to 35.4 | -49.6 to 47.3 |
| $\overline{\Delta D_{SSDE,organ}}$ (%) | 13.1 | 14.1 | 13.7 |
| $\Delta S_{SSDE,organ}$ (%) | 9.2 | 10.0 | 10.1 |
| $T_U(\%)$ | 30.7 | 33.2 | 33.0 |

366

367 **Table 10:** Frequency table of nD_{liver} , nD_{spleen} , and nD_{kidney} relative to SSDE from routine TCM abdominal/pelvis exams

| | nD _{liver} (N=107) | nD _{spleen} (N=107) | nD _{kidney} (N=107) |
|---------------------------|--------------------------------|---------------------------------|---------------------------------|
| within $\pm 20\%$ of SSDE | $88 C_p = 82.2\%$ | 81 $C_p = 75.7\%$ | 83 $C_p = 77.6\%$ |
| within ± 30% of SSDE | 104 $C_p = 97.2\%$ | 99 $C_p = 92.5\%$ | $100 C_p = 93.5\%$ |
| beyond ± 30% of SSDE | $3 C_p = 2.8\%$ | $8 C_p = 7.5\%$ | 7 $C_p = 6.5\%$ |

369

370 4. DISCUSSION

371 In this study, SSDE was compared to organ dose estimates from validated, direct MC simulation 372 methods for three routine CT examinations across a wide range of patient sizes that included pediatric 373 patients, adult patients, and, for the body scans, bariatric patients. The framework for evaluation, 374 specifically for those exams using TCM, is outlined in Figure 3. The routine examinations included head 375 exams performed with FTC, chest and abdomen/pelvis exams performed with TCM. Unlike the Moore et 376 al. and Sinclair et al. studies mentioned previously, this study used D_w estimates taken either from patient 377 topograms or image data to calculate the SSDE as opposed to the geometric size descriptor of ED. 378 Moreover, this study directly evaluated SSDE on a per-organ basis with the aim of providing an upper 379 tolerance limit for which SSDE will cover 95% of the population (p = 0.95) with 95% confidence ($\alpha =$ 0.05) for a particular organ. Lastly, the evaluation of the SSDE was performed to test if the $T_U \leq 20\%$ 380 381 between SSDE and patient dose as noted in AAPM Report 204.

382 For routine FTC head exams, this study observed that the T_U for the difference between nD_{brain} 383 and SSDE from AAPM 293 needed to cover 95% of the population with 95% confidence was 12.5%. 384 Additionally, as can be seen in Figure 4, all 15 nD_{brain} values were within 20% of SSDE ($C_p = 100.0\%$). 385 This suggests that the T_U of 20% between SSDE and patient dose noted in AAPM Report 204 may be 386 appropriate for routine head CT examinations employing FTC and that SSDE may serve as a good 387 estimate for brain parenchyma dose to within 12.5% for at least 95% of the population. There are two 388 explanations for this observation. The first is that SSDE reported in both AAPM Reports 293 and 204 389 were derived from FTC measurements and simulations [11], [12]. The second explanation is related to the 390 fact that, as noted in Hardy et al. [18], the head is composed of homogenous tissue encased in bone, 391 which SSDE in AAPM Report 293 took into consideration. Thus, as can be seen again in Figure 4, the 392 nD_{brain} as a function of D_w follows the SSDE curve, the average difference between them being less than 393 5% ($\overline{\Delta D_{SSDE, brain}}$ = 4.4%) with $\Delta S_{SSDE, brain}$ of only 3.2%. AAPM Report 293 does not explicitly note the 394 same $\pm 20\%$ difference between SSDE and patient dose (brain parenchyma dose in this case) as in AAPM 395 Report 204 [11], [12]. AAPM Report 293, however, is an extension of AAPM Report 204 [11], [12].

396 For routine chest, this study evaluated SSDE against both CTDI_{vol.32}-normalized lung and breast 397 doses. This study observed that, when using $\text{CTDI}_{vol,32}$ as the normalization for lung dose, the T_U for the 398 difference between nD_{lung} and SSDE needed to cover 95% of the population with 95% confidence was 399 35.6%. This result suggests that the 20% difference between SSDE and patient dose noted in AAPM 400 Report 204 might not be sufficient for SSDE to cover 95% of nD_{lung} cases from routine chest exams 401 employing TCM. Rather, the results of this study suggest that a wider tolerance may be needed in order 402 for SSDE to serve as an estimate of lung dose. One possible reason for this has to do with the longitudinal 403 modulation provided by CAREDose4D. In terms of dose reduction, TCM has been shown to reduce lung 404 and breast dose relative to FTC in chest exams [29]. Because of the lower overall normalized dose 405 provided by TCM relative to FTC, SSDE, as can be seen in Figure 5A, are a conservative estimate of 406 nD_{lung} , with the vast majority of the data points falling within 30% of SSDE ($C_p = 92.5\%$). Additionally, 407 as can also be seen in **Figure 5A**, nD_{lung} values and regression fits tend to track closer to SSDE with

408 increasing D_w , most probably due to the response of the AEC system of maxing out tube current output 409 for larger-sized patients. **Figure 7** below shows the TCM profile of a non-bariatric and a bariatric patient 410 administered a routine chest exam. In **Figure 7B**, this TCM profile has very little longitudinal modulation 411 due to the attenuation characteristics of the patient. Although the number of bariatric patients in this study 412 was limited, this trend may nevertheless suggest different regimes within the normalized dose curves in 413 relation to tube output potential of a scanner and patient size.

414



415

Figure 7: Examples of TCM profile from a routine chest exam of a A) typical, non-bariatric patient and
B) bariatric patient. In B), longitudinal modulation is minimal due to patient size and tube current
limitation.

420 This study observed that the T_U for the difference between nD_{breast} and SSDE needed to cover 421 95% of the population with 95% confidence was observed to be 68.3%. These observations can be seen 422 more clearly in **Figure 5B** for nD_{breast} . nD_{breast} values, as well as the corresponding regression fits between 423 nD_{breast} and D_w , were systematically below SSDE with only a few exceptions (nD_{breast} : $\overline{\Delta D_{SSDE, breast}} =$ 424 31.8%, $\Delta S_{SSDE, breast} = 18.7\%$). As was seen in the lung, the normalized breast dose from TCM is 425 systematically smaller than SSDE. Thus, this study suggests that SSDE may be a conservative estimate 426 for nD_{breast} for most of the population. A tolerance wider than the 20% difference between patient dose 427 and SSDE specified in AAPM Report 204 would be needed to encompass 95% with 95% confidence of 428 nD_{breast}.

429 For abdomen/pelvis exams, this study found that that the T_{II} for the difference between nD_{liver} , 430 nD_{spleen} , and nD_{kidney} and SSDE needed to cover 95% of the population with 95% confidence was 30.7%, 431 33.2%, and 33.0%, respectively. These results indicate that a tolerance wider than a 20% difference 432 between SSDE and CTDI_{vol.32}-normalized organ dose would be needed to capture 95% of nD_{liver}, nD_{spleen}, 433 and nD_{kidney} cases with 95% confidence. These results are illustrated in the Figure 6 for nD_{liver} , nD_{spleen} , 434 and nD_{kidney} , respectively, wherein, for all three organs, the vast majority of the nD_{liver} , nD_{spleen} , and 435 nD_{kidney} cases are within 30% of SSDE ($C_p = 97.2\%$, $C_p = 92.5\%$, and $C_p = 93.5\%$, respectively). 436 Additionally, as can be seen in **Table 9**, all three of these organs had fairly similar deviations from SSDE as indicated by the proximity of their $\overline{\Delta D_{SSDE.organ}}$ and $\Delta S_{SSDE.organ}$ values to one another. Given this, an 437 438 equivalent T_U for these three organs of the abdomen/pelvis is a reasonable result.

439 A general trend was observed that normalized doses from TCM protocols were lower than SSDE. 440 This observation is intuitive given that TCM reduces normalized dose relative to FTC [29]. The data 441 suggests that another model of normalized dose that takes into consideration the effects of TCM may be 442 needed. A potential candidate for such a dose model that considers TCM is the generalized linear model 443 (GLM) developed by Bostani et al. [30]. The GLM is a statistical dose model that allows for the inclusion 444 of categorical variables for different radiosensitive organs and scanners and was constructed with TCM 445 MC simulations [30]. Given the widespread use of TCM, it is possible that normalized dose coefficients 446 derived from GLM may be more appropriate in the current context of clinical practice. This, though, 447 would require further investigation.

This study had a few advantages. This study capitalized on the strengths of the direct MC simulation approach to evaluate SSDE in light of organ dose estimates that are reflective of actual patient anatomy and actual, clinical TCM schemes. The evaluation of SSDE was performed on a per-organ basis using those MC-derived organ dose estimates across a range of patient sizes and across several routine protocols. Even given these advantages, however, this study nevertheless had a few limitations. For head exams, though the expectation is that brain parenchyma dose from FTC will not significantly deviate from SSDE, the sample sizes were nevertheless small because organ dose data was based on previous work. 455 Future work would involve using a large sample size to evaluate SSDE for the doses for this protocol. For 456 those routine examinations employing TCM, which was the majority of the protocols investigated herein, 457 only one AEC algorithm from one manufacturer, Siemens, was considered due to the lack of accessibility 458 of complete TCM information from other scanner manufacturers. Future work would involve performing 459 the direct simulation method with TCM information from other manufacturers and scanners. Additionally, 460 though this study attempted to evaluate SSDE across a range of patient sizes, this study only contained a 461 limited number of bariatric patients. Future work in this avenue would involve the incorporation of more 462 bariatric patients in the evaluation of SSDE.

463

464 **5. CONCLUSION**

465 This study evaluated SSDE as an estimate of organ dose in light of organ dose estimates from 466 direct MC simulation methods, using the 20% threshold mentioned in AAPM Report 204 as the point of 467 departure for the evaluation. In the case of routine exams, with the exception of brain parenchyma doses 468 routine FTC head exams, the null hypothesis of this study was rejected in that T_U was found to be greater 469 than 20% for the organ doses investigated from body routine exams. Results indicate that a 20% threshold 470 difference is most likely sufficient for 95% coverage of brain parenchyma dose cases from routine FTC 471 head exams. For body exams using TCM, a threshold difference of ~30-36% would be wide enough to 472 cover the majority (95%) of the organs investigated in this study, excluding the breasts, where SSDE 473 serves as a conservative estimate.

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