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## Modeling and Evaluation of a High-Resolution CMOS Detector for Cone-Beam CT of the Extremities

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### Abstract

**Purpose**—Quantitative assessment of trabecular bone microarchitecture in extremity cone-beam CT (CBCT) would benefit from the high spatial resolution, low electronic noise, and fast scan time provided by complementary metal-oxide semiconductor (CMOS) x-ray detectors. We investigate the performance of CMOS sensors in extremity CBCT, in particular with respect to potential advantages of thin (<0.7 mm) scintillators offering higher spatial resolution.

**Methods**—A cascaded systems model of a CMOS x-ray detector incorporating the effects of CsI:Tl scintillator thickness was developed. Simulation studies were performed using nominal extremity CBCT acquisition protocols (90 kVp, 0.126 mAs/projection). A range of scintillator thickness (0.35–0.75 mm), pixel size (0.05–0.4 mm), focal spot size (0.05–0.7 mm), magnification (1.1–2.1) and dose (15–40 mGy) was considered. Detectability index was evaluated for both CMOS and a-Si:H flat-panel detector (FPD) configurations for a range of imaging tasks emphasizing spatial frequencies associated with feature size  $a_{obj}$ . Experimental validation was performed on a CBCT test-bench in the geometry of a compact orthopedic CBCT system (SAD = 43.1 cm, SDD = 56.0 cm, matching that of the Carestream OnSight 3D system). The test-bench studies involved a 0.3 mm focal spot x-ray source and two CMOS detectors (Dalsa Xineos-3030HR, 0.099 mm pixel pitch) - one with the standard CsI:Tl thickness of 0.7 mm (C700) and one with a custom 0.4 mm thick scintillator (C400). Measurements of modulation transfer function (MTF), detective quantum efficiency (DQE), and CBCT scans of a cadaveric knee (15 mGy) were obtained for each detector.

**Results**—Optimal detectability for high-frequency tasks (feature size of ~0.06 mm, consistent with the size of trabeculae) was ~4× for the C700 CMOS detector compared to the a-Si:H FPD at nominal system geometry of extremity CBCT. This is due to ~5× lower electronic noise of a CMOS sensor, which enables input quantum-limited imaging at smaller pixel size. Optimal pixel size for high-frequency tasks was <0.1 mm for a CMOS, compared to ~0.14mm for an a-Si:H FPD. For this fine pixel pitch, detectability of fine features could be improved by using a thinner scintillator to reduce light spread blur. A 22% increase in detectability of 0.06 mm features was found for the C400 configuration compared to C700. An improvement in the frequency at 50%

modulation ( $f_{50}$ ) of MTF was measured, increasing from 1.8 lp/mm for C700 to 2.5 lp/mm for C400. The C400 configuration also achieved equivalent or better DQE as C700 for frequencies above  $\sim 2 \text{ mm}^{-1}$ . Images of cadaver specimens confirmed improved visualization of trabeculae with the C400 sensor.

**Conclusions**—The small pixel size of CMOS detectors yields improved performance in high-resolution extremity CBCT compared to a-Si:H FPDs, particularly when coupled with a custom 0.4 mm thick scintillator. The results indicate that adoption of a CMOS detector in extremity CBCT can benefit applications in quantitative imaging of trabecular microstructure in humans.

## 1. INTRODUCTION

A variety of dedicated cone-beam CT (CBCT) systems for imaging of musculoskeletal extremities have recently been introduced.<sup>1, 2</sup> Owing to the use of a-Si:H flat-panel detectors (FPDs) and compact x-ray sources, extremity CBCT achieves a compact scanner design that offers simplified logistics, lower cost, and lower imaging dose compared to conventional CT. For example, the OnSight 3D system (Carestream Health, Rochester NY) uses a Varex PaxScan2530 FPD (Varex, Salt Lake City UT) with 0.139 mm pixel pitch, 0.7 mm CsI:Tl scintillator, and a 0.5 focal spot (FS, IEC336 standard) stationary anode x-ray source. Scan dose is 5–15 mGy, the field-of-view (FOV) is  $20 \times 20 \times 20 \text{ cm}^3$ , and typical scan time is  $\sim 30 \text{ s}$ .<sup>3</sup> Spatial resolution permits visualization of  $\sim 0.25\text{--}0.35 \text{ mm}$  high-contrast features (frequency at 10% of the modulation transfer function,  $f_{10}$ , approximately  $1.5\text{--}1.8 \text{ mm}^{-1}$ ), yielding improved visualization of bone detail compared to MDCT.<sup>4, 5</sup> A compact gantry with flexible positioning capability permits weight-bearing imaging of lower extremities in addition to non-weight-bearing acquisitions, providing new insight in weight-bearing evaluation of areas such as osteoarthritis,<sup>6–8</sup> patellar malformation,<sup>9</sup> and flatfoot deformity.<sup>10</sup>

The high spatial resolution motivates application of extremity CBCT in quantitative imaging of bone microstructure.<sup>11–15</sup> Trabecular and cortical microarchitecture are biomarkers of bone health, with indices of bone microstructure found to improve prediction of fracture risk in osteoporosis (OP)<sup>11, 16–24</sup> compared to bone mineral density (BMD). In osteoarthritis (OA), alterations in trabecular microarchitecture of subchondral bone often precede cartilage degeneration,<sup>25–27</sup> motivating investigation of structural metrics as an early biomarker of disease. However, trabecular features typically measure  $0.05\text{--}0.2 \text{ mm}$ ,<sup>28</sup> so ultra-high-resolution pre-clinical micro-CT<sup>29</sup> remains the gold standard for bone morphometry. To enable *in vivo* measurements of microstructure in patients, a dedicated high-resolution peripheral quantitative CT (HR-pQCT) system has been developed<sup>30, 31</sup> for use in distal radius and ulna. Applications of HR-pQCT in more attenuating body sites, such as the knee, require long scan times ( $\sim 20 \text{ min}$ ) and have limited axial field-of-view (FOV) of  $\sim 6 \text{ cm}$ .<sup>32</sup> Accurate characterization of bone morphometry via multi-detector CT, CBCT, and/or MRI could greatly enhance the clinical utilization of such quantitative biomarkers.

Despite their limited spatial resolution, conventional multi-detector CT and a-Si:H FPD-based CBCT systems have been shown to achieve statistically significant correlation with gold standard micro-CT for a variety of trabecular metrics.<sup>21–23</sup> In extremity CBCT, Pearson R-coefficient of 0.9 for Bone Volume (BV/TV), 0.66 for Trabecular Thickness (Tb.Th) and

0.68 for Trabecular Spacing (Tb.Sp) were found in comparison to micro-CT.<sup>14</sup> While promising, this result suggests that application of CBCT in quantitative bone imaging would benefit from further improvement in spatial resolution. Complementary metal-oxide semiconductor (CMOS) x-ray detectors offer a compelling alternative to a-Si:H FPDs for such high-resolution applications, owing to their higher readout speed, up to 10× lower electronic noise, and finer pixel pitch (~0.05–0.1 mm).<sup>33–36</sup>

In the recent years, CMOS detectors emerged as an attractive option for indirect detection x-ray detectors. Early interest in medical applications of CMOS sensors has been primarily focused on breast imaging. In digital breast tomosynthesis (DBT), Choi *et al*<sup>37</sup> and Patel *et al*<sup>38</sup> showed that the low electronic noise of CMOS detectors enables improved angular sampling by lowering the required dose per frame. In breast CBCT, Gazi *et al*<sup>39</sup> and Shen *et al*<sup>36</sup> demonstrated 125% increase in system limiting resolution and 45% enhancement in visibility of microcalcifications, respectively, compared to conventional a-Si:H FPDs. A model by Zhao *et al*<sup>40</sup> found that a commercial CMOS sensor operated in a low capacity, low noise mode can improve contrast-to-noise ratio (CNR) of small microcalcifications (<0.2 mm) at lower mean glandular dose levels compared to an existing commercial DBT system. This analysis was extended to include models of DBT image reconstruction, image display and human observer performance.<sup>41</sup> Vedantham *et al*<sup>42</sup> used task-based modelling to investigate the tradeoffs between pixel size and scintillator thickness in breast CBCT and determined that a 0.525 mm thick CsI:Tl scintillator (somewhat thinner than the 0.6–0.7 mm CsI:Tl typically used in FPDs) is optimal for detecting 0.22 mm microcalcifications.

Results of modeling and optimization studies in breast imaging are not directly applicable to extremity CBCT due to differences in x-ray spectrum (~90 kV in extremity CBCT compared to ~30 kV in DBT), object composition, and system geometry. We use a cascaded systems model developed specifically for CMOS-based extremity CBCT to evaluate performance in high-resolution applications using task-based detectability index framework.<sup>13, 43</sup> In particular, we investigate the potential benefits of reducing the thickness of the CsI:Tl scintillator below 0.6–0.7 mm as currently used in a-Si:H FPDs and CMOS sensors for CBCT. Thinner CsI:Tl reduces scintillator blur (potentially better matching the blur associated with the finer pixel aperture), but leads to increased noise due to diminished x-ray absorption, especially for the relatively high x-ray energies used in extremity imaging. For high-frequency tasks, however, the benefits of enhanced spatial resolution may outweigh the impact of elevated noise, resulting in improved detectability. Preliminary results<sup>15</sup> indicate that the visibility of trabeculae can indeed be improved using a 0.4 mm scintillator compared to the standard 0.7 mm thickness.

The work reported below extends the simulation and experimental studies reported in Ref. 15 to provide a more detailed analysis of CMOS detector performance across a broader scope of system parameters and imaging geometries using a new, continuously tunable spectrum of imaging tasks representative of trabecular bone morphometry. The main contributions of this work include: (a) a model of a CMOS x-ray sensor that incorporates the effects of scintillator thickness; (b) a study of detectability in extremity CBCT as a function of feature size, pixel size, electronic noise, CsI:Tl thickness, focal spot size, dose, and system magnification; and (c) experimental validation in phantom and cadaver studies using

two CMOS detectors, one with the current standard CsI:Tl thicknesses of 0.7 mm (denoted C700), and one (C400) custom-made with 0.4 mm thick CsI:Tl. This direct experimental comparison provides new insight into the tradeoffs between resolution, noise, and imaging task that govern the choice of scintillator thickness for high-resolution applications of CMOS sensors. The results motivated implementation of a CMOS detector on a prototype high-resolution extremity CBCT system based on the OnSight 3D gantry.

## 2. METHODS AND MATERIALS

### 2.A Task-based evaluation of CMOS detectors in high-resolution extremity CBCT

The performance of CMOS detectors in extremity CBCT imaging was investigated in terms of modulation transfer function (MTF), noise-power spectrum (NPS), detective quantum efficiency (DQE), and detectability index:

$$d^2 = \frac{\left( \int \int T_{system}^2 W_{task}^2 dudv \right)^2}{\int \int NNPS \cdot T_{system}^2 W_{task}^2 dudv} \quad (1)$$

The non-prewhitening (NPW) observer model (Equation 1) has been shown to agree reasonably well with human observer performance in CBCT for a wide range of simple imaging tasks.<sup>44</sup> The task function,  $W_{task}$ , is a frequency-domain specification of the feature(s) of interest in detection or discrimination. The  $NNPS$  is the normalized NPS, and  $T_{system}$  is the MTF of the system. The NPS and MTF were obtained from cascaded systems analysis of CMOS x-ray sensors, as described below. Since the focus of the current study is on the effects of detector design on imaging performance, the modeling was performed in the 2D projection domain and did not include signal and noise propagation in the 3D reconstruction cascade.<sup>45, 46</sup> The NPS in the denominator of Eq. (1) is normalized by the mean detector signal squared. As shown by Tward et al<sup>45</sup>, the resulting NNPS is equivalent to the NPS of log-corrected projection data. The form in Eq. (1) therefore represents a detection task in log-corrected projection data. The detectability index was investigated as a function of scintillator thickness, pixel size, electronic noise, scan dose, focal spot size, and imaging task.

The description of theoretical methods is organized as follows: Section 2.A.1 introduces the basic cascaded systems model and defines fixed system parameters and key variables. Section 2.A.2 describes the modeling of scintillator thickness-dependent system gain, including quantum detection efficiency, generation of optical photons in the scintillator, depth-dependent scintillator escape fraction, and coupling efficiency. Models of thickness-dependent scintillator blur, focal spot blur, and system MTF are discussed in Sec. 2.A.3. Section 2.A.4 concerns the NPS and includes discussion of Swank factor and assumptions regarding Lubberts effect. Section 2.A.5 introduces task functions pertinent to high-resolution extremity imaging, and Sec. 2.A.6 outlines the simulation studies evaluating task-based detectability. The cascaded systems model is consistent with a significant body of previous work modeling a-Si:H FPDs<sup>43, 47-50</sup> and more recently CMOS systems<sup>40, 51</sup> with

details below emphasizing aspects of the model related to scintillator thickness and pixel size.

### 2.A.1 Cascaded systems model of a CMOS detector with a CsI:TI scintillator—

The analytical detector model consisted of the following 7 stages:<sup>43</sup> x-ray absorption in the scintillator (quantum detection efficiency, QDE), generation of light quanta (quantum gain), light spread in the scintillator (including the spread of K-fluorescence photons<sup>52</sup>), coupling to the photodiode, integration by pixel aperture, sampling, and readout with additive noise. Effects of scatter were not considered in the model. For input-quantum-limited conditions, scatter imparts a scaling of the NPS by a factor of  $(1 + \text{SPR})$ , where SPR is the scatter-to-primary ratio<sup>53</sup>. In the majority of studies performed here, various detector configurations are compared at the same system geometry and thus the same SPR. Consequently, it is assumed that the omission of scatter from the model has only minor impact on the metrics of relative detector performance investigated in this study. The parameters of the model are listed in Table 1, with nominal values reflecting two Xineos-3030HR CMOS detectors (Teledyne DALSA) with CsI thicknesses of 0.4 mm and 0.7 mm used in experimental studies (Sec. 2.2 – 2.4).

**2.A.2. System gain—**Using the definitions in Table 1, the system gain  $G$  ( $e^-/\text{incident x-ray/pixel}$ ) is given by:

$$G(t_{CsI}) = a_{pd}^2 \bar{g}_1(t_{CsI}) \bar{g}_2(t_{CsI}) \bar{g}_A \quad (2)$$

where  $t_{CsI}$  is scintillator thickness. The mean quantum detection efficiency,  $\bar{g}_1(t_{CsI})$ , is calculated by dividing the scintillator into a series of 200 slabs (thickness denoted  $\Delta z$  and integrating over the slab depth ( $z$ ) measured from the incident surface:<sup>48</sup>

$$g_1(E, z) = e^{-z \cdot \rho_{CsI} \cdot f_{CsI} \cdot \left(\frac{\mu}{\rho}\right)_{CsI}(E)} \left( 1 - e^{-\Delta z \cdot \rho_{CsI} \cdot f_{CsI} \cdot \left(\frac{\mu}{\rho}\right)_{CsI}(E)} \right) \quad (3a)$$

$$g_1(E, t_{CsI}) = \int_0^{t_{CsI}} g_1(E, z) dz \quad (3b)$$

$$\bar{g}_1(t_{CsI}) = \frac{\int_0^{E_{max}} q_{det}(E) g_1(E, t_{CsI}) dE}{\int_0^{E_{max}} q_{det}(E) dE} \quad (3c)$$

where  $\left(\frac{\mu}{\rho}\right)_{CsI}(E)$  is the mass attenuation coefficient of CsI and  $q_{det}(E)$  is the spectrum at the detector (input spectrum  $q_0(E)$  attenuated by the object). Within each slab, three parallel pathways for the quantum gain  $g_2$  are considered: pathway A (gain denoted by  $\bar{g}_{2A}$ )

describes local absorption of an X-ray photon without K-fluorescence; pathway B ( $\overline{g_{2B}}$ ) accounts for locally absorbed energy resulting from K-fluorescent events; and pathway C ( $\overline{g_{2C}}$ ) involves K-fluorescence x-ray photons produced locally but absorbed at a remote site, with the associated MTF denoted  $T_K$ .<sup>52</sup>

$$\overline{g_{2A}}(t_{CsI}) = \frac{\int_0^{E_{max}} q_{det}(E) \int_0^{t_{CsI}} g_1(E, z) \eta_{esc}(t_{CsI}, z) (1 - \xi\omega) EW dz dE}{\int_0^{E_{max}} q_{det}(E) g_1(E, t_{CsI}) (1 - \xi\omega) dE} \quad (4a)$$

$$\overline{g_{2B}}(t_{CsI}) = \frac{\int_0^{E_{max}} q_{det}(E) \int_0^{t_{CsI}} g_1(E, z) \eta_{esc}(t_{CsI}, z) \xi\omega (E - E_K) W dz dE}{\int_0^{E_{max}} q_{det}(E) g_1(E, t_{CsI}) \xi\omega dE} \quad (4b)$$

$$\overline{g_{2C}}(t_{CsI}) = \frac{\int_0^{E_{max}} q_{det}(E) \int_0^{t_{CsI}} g_1(E, z) \eta_{esc}(t_{CsI}, z) \xi\omega f_K(t_{CsI}) E_K W dz dE}{\int_0^{E_{max}} q_{det}(E) g_1(E, t_{CsI}) \xi\omega dE} \quad (4c)$$

The escape fraction  $\eta_{esc}(t_{CsI}, z)$  refers to the fraction of optical photons that reach the scintillator exit surface and are subsequently coupled to the photodiode with efficiency  $\overline{g_4}$ . An linear fit to escape fraction estimated by Howansky *et al*<sup>7</sup> for a scintillator with reflective backing was used to compute  $\eta_{esc}$ :

$$\eta_{esc}(t_{CsI}, z) = -0.185(t_{CsI} - z) + 0.312 \quad (5)$$

The quantum gain for each parallel pathway  $\overline{g_{2A}}(t_{CsI})$ ,  $\overline{g_{2B}}(t_{CsI})$  and  $\overline{g_{2C}}(t_{CsI})$  are combined to form the total gain  $\overline{g_2}(t_{CsI})$ <sup>52</sup>:

$$\overline{g_2}(t_{CsI}) = (1 - \xi\omega)\overline{g_{2a}}(t_{CsI}) + \xi\omega\overline{g_{2b}}(t_{CsI}) + \xi\omega f_K \overline{g_{2c}}(t_{CsI}) \quad (6)$$

The loss of photons in the optical stack between the scintillator exit surface and the photodiode (e.g. due to fiber-optic plate and optical glue) and the conversion efficiency from optical photons to electrons are described together by the optical coupling efficiency  $\overline{g_4}$ . The coupling efficiency was treated as a constant across all detector configurations. The value of  $\overline{g_4}$  was determined empirically to yield a good match between the model and measurements of system gain and noise power spectra (Sec. 2.3). It was found that the estimates of the coupling efficiency were different for the two detectors:  $\overline{g_4}=0.7$  for C400 and  $\overline{g_4}=0.48$  for C700. This discrepancy is likely due to variations in CsI deposition techniques and in the quality of the interface between the CMOS and scintillator. Such variability represents differences in the manufacturing process rather than true dependence of  $\overline{g_4}$  on scintillator thickness. Therefore, the mean of the two empirical estimates ( $\overline{g_4}=0.59$ ) was used in the

detector model to approximate an average coupling efficiency of a CMOS detector of the type used in the experimental studies. The coupling efficiency values found for the two detectors were lower than those reported for a-Si:H FPDs ( $\overline{g_4} \approx 0.8$ ), likely due to light losses in the fiber-optic plate, which is not used in a-Si:H FPDs.

Fig. 1A illustrates the thickness-dependent QDE (black line), escape fraction

$\overline{\eta_{esc}} = \int_0^{t_{CsI}} \eta_{esc}(t_{CsI}, z) dz$  (dashed black line), and quantum gain (gray line) as functions of CsI:Tl thickness. As anticipated, QDE increases with increasing thickness; however, quantum gain decreases for thicker CsI:Tl because of reduced escape efficiency. Overall, the  $\overline{g_1 g_2}$  product is ~21% higher for 0.7 mm CsI:Tl than 0.4 mm CsI:Tl.

**2.A.3. System MTF, detector blur, and focal spot blur**—System MTF is defined as the product of detector and focal spot MTFs:  $T_{system}(u, v; t_{CsI}, a_{spot}) = T_{det}(u, v; t_{CsI}) \cdot T_{system}(u, v; a_{spot})$ . The detector MTF,  $T_{det}$  is given by:

$$T_{det}(u, v; t_{CsI}) = T_3(u, v; t_{CsI}) T_{Ktot}(u, v; t_{CsI}) T_5(u, v) \quad (7)$$

where  $T_3$  denotes scintillator blur,  $T_{Ktot}$  is the blur associated with the spread of K-fluorescence photons, and  $T_5$  is the aperture function  $T_5(u, v) = |\text{sinc}(a_p, u) \text{sinc}(a_p, v)|$ . Both  $T_3$  and  $T_{Ktot}$  are affected by scintillator thickness  $t_{CsI}$ . The scintillator blur is modeled using a two-component form that consists of an exponential term to account for a homogeneous, unstructured layer of CsI:Tl deposited on the surface of the scintillator, and a Lorentzian term describing the blur in the structured, columnar CsI:Tl layer:<sup>58</sup>

$$T_3(u, v; t_{CsI}) = A e^{-|\sqrt{u^2+v^2}|/B} + \frac{1-A}{1+H(t_{CsI}) \cdot (u^2+v^2)} \quad (8)$$

where the terms  $A$  and  $B$  are independent of CsI:Tl thickness, and  $H(t_{CsI})$  is a polynomial function of scintillator thickness. Each parameter was obtained from an empirical fit to measured presampling MTFs of CMOS detectors with 0.4 mm and 0.7 mm CsI:Tl (Section 2.3).

The total K-fluorescence blur,  $T_{Ktot}$ , weighs the K-fluorescence blur  $T_K$  by the gains of the individual pathways of  $g_2$ :<sup>47</sup>

$$T_{Ktot}(u, v; t_{CsI}) = \frac{(1-\xi\omega)\overline{g_{2a}} + \xi\omega\overline{g_{2b}} + \xi\omega\overline{g_{2c}} f_k(t_{CsI}) T_K(u, v; t_{CsI})}{\overline{g_2}} \quad (9)$$

where  $f_k(t_{CsI})$  is the probability of remote absorption for an K-fluorescence photon, and  $T_K(u, v; t_{CsI})$  is the spread associated with that absorption. Both  $f_k(t_{CsI})$  and  $T_K(u, v; t_{CsI})$  were computed from analytical models of Chan et al. and Que et al.<sup>59, 60</sup>

Similar to previous cascaded systems studies of extremity CBCT, a simplified Gaussian model of focal spot blur  $T_{spot}$  was adopted:<sup>49, 61</sup>

$$T_{spot}(u, v; a_{spot}) = \exp\left(-\pi(M-1)^2 a_{spot}^2 (u^2 + v^2)\right) \quad (10)$$

where  $M = SDD/SAD$  and the nominal value of parameter  $a_{spot}$  was set to 0.5 mm. Note that while the  $a_{spot}$  parameter in the simulations has a unit of mm, the x-ray source employed in the experiments is characterized using the focal spot index (IEC 336 standard, denoted FS), representing a range of focal spot size.

**2.A.4. Noise-power spectrum in projection images**—Using the gain and blur terms defined above, the NPS of a 2D projection image is:

$$S_{det} = \bar{q}_0 a_{pd}^4 \overline{g_1 g_2 g_4} (1 + \bar{g}_4 P_K T_3^2) T_5^2 * III_6 + S_{add} \quad (11)$$

where the functional parameters were omitted for simplicity and  $a_{pd} = \sqrt{f_{pix} a_{pix}}$  is the active pixel area. The comb function  $III_6 = \sum_N \delta(N/a_{pix})$  represents aliasing of quantum noise due to pixel sampling.  $S_{add}$  is the power spectrum of additive noise ( $\sigma_{add}^2 a_{pix}^2$ ).  $P_K$  is a noise term associated with quantum gain as described by Richard<sup>62</sup>. In the case of no K-fluorescence,  $P_K = \bar{g}_{2A} + \varepsilon_{g_{2A}}$ , where  $\varepsilon_{g_{2A}}$  is the Poisson excess associated with local x-ray absorption. Considering K-fluorescence,  $P_K$  combines the gain and Poisson excess for the three parallel cascades of  $\bar{g}_2$  (Eq. 4), as well as a cross term in noise between pathways B and C. The Poisson excess in each path is computed from the gain (Eq. 4) and Swank factor specific to each path. The Swank factors were derived from the product of a radiological Swank factor and an optical Swank factor, the same for all pathways, weighted by the gain in each pathway. The CsI thickness-dependent radiological component is associated with polyenergetic absorption and was computed from the result of Zhao *et al.*<sup>58</sup> The optical component is due to light losses in the scintillator. For simplicity, it is assumed to be independent of CsI thickness and equal to 0.95, giving good agreement with the measured NPS on the C400 and C700 CMOS detectors. This value also agrees fairly well with an approximate estimate of the optical Swank factor  $I_{opt}$  given by the following equation from Lubinsky *et al.*<sup>63</sup>

$$I_{OPT}(t_{CsI}) = \frac{\langle \eta_{esc}(t_{CsI}, z) \rangle^2}{\langle \eta_{esc}(t_{CsI}, z)^2 \rangle} \quad (14)$$

This formula yields  $I_{opt} = 0.98$  for 0.7 mm CsI and  $I_{opt} = 0.99$  for 0.4 mm CsI. While the above equation is approximate and was derived under certain simplifying assumptions, it further justifies modeling  $I_{opt}$  as largely independent of  $t_{CsI}$  and supports the empirical value of 0.95 used in this study.



With the above definitions, the normalized NPS (NNPS) in Eq. 1 is given by:

$$NNPS = S_{det} / (a_{pd}^2 \overline{g_1 g_2 g_4})^2 \quad (15)$$

The noise model accounts for the effects of scintillator thickness on detector gain and *MTF*. However, the Lubberts effect<sup>64, 65</sup> (i.e., noise amplification due to the depth-dependent light spread from individual scintillation events) is assumed to be negligible. This assumption is supported by experimental results for columnar CsI:Tl scintillators<sup>66</sup>, showing negligible contribution from the Lubberts effect (ratio of the square of detector *MTF* to *NNPS* very close to unity) over a broad range of scintillator thickness (~0.2 mm to ~0.6 mm).

The dashed gray line in Fig. 1B shows the integral of NNPS over the Nyquist frequency range as a function of scintillator thickness at an exposure of 0.126 mAs. Despite the increased escape fraction that partly compensates for the reduced QDE of thin scintillators (Fig. 1A) in mean signal, the projection noise substantially increases with decreasing CsI:Tl thickness. The plot of the zero-frequency  $P_k$  (black line) in Fig. 1B explains this behavior: the improved  $\overline{g_2}$  of thin scintillators leads to increasing contribution of the associated conversion noise encapsulated by  $P_k$ .

**2.A.5. Imaging task**—We considered task functions representing discrimination of two Gaussian stimuli of different widths, defined in the detector plane as:

$$W_{task}(u, v) = CM^2 \left[ e^{-2\pi^2(kMa_{obj})^2(u^2+v^2)} - e^{-2\pi^2(Ma_{obj})^2(u^2+v^2)} \right] \quad (16)$$

where  $C$  is a contrast term,  $M$  is the system magnification,  $a_{obj}$  is the feature size measured in the object plane, and  $k$  is a parameter that determines the relative width of the Gaussian stimuli. Here,  $k$  was set at 0.8, and  $a_{obj}$  was varied to simulate a range of anatomical feature sizes and associated spatial frequency bands (Fig. 1C). In the context of trabecular bone imaging, an increase in detectability of the task in Eq. (13) indicates improved ability to discriminate trabeculae (or trabecular cavities) that differ in size by 20%, and could thus indicate improved assessment of change in trabecular thickness (or trabecular spacing).

Holding other parameters of Eq. (13) fixed, a change in feature size,  $a_{obj}$  implies a change in the area under  $W_{task}^2$ —i.e., signal power. To account for this scaling, the results below are reported in terms of relative  $d^2$ , where the detectability for a given feature size is normalized to a reference value (e.g., the value at nominal system parameters) for the same feature size. Detector performance for various tasks (feature sizes) is then compared in terms of this relative detectability, and the contrast term  $C$  cancels out for all cases (can be ignored) and was set to unity.

**2.A.6 Simulation studies**—Detectability for the task function of Eq. (13) for feature sizes ranging from 0.03 to 0.2 mm<sup>28</sup> was studied in relation to five system parameters (Table

1, Key Variables): pixel size ( $a_{pix}$ ), scintillator thickness ( $t_{CsI}$ ), focal spot blur ( $a_{spot}$ ), magnification ( $M$ ) and bare-beam x-ray exposure.

The x-ray spectrum ( $q_0(E)$ ) was obtained using the Spektr 3.0<sup>54</sup> implementation of TASMICS<sup>67</sup> for a beam energy of 90 kV. Tube inherent filtration was found experimentally by estimating Al thickness that achieved best match of detector entrance dose between Spektr simulations and measurements on the benchtop x-ray source (Sec. 2.2) performed with a Si diode (AccuDose, RadCal Corp., Monrovia, CA) for 70, 80, 90, and 100 kV beams. The added filtration (Table 1) was the same as the filters applied in the experimental setup. Additionally, differences in tube output (mGy/mAs) between the Spektr 3.0 model and the source used in the experiments were accounted for by fitting a constant scale factor.

The nominal SDD was set to 560 mm and nominal magnification was set to 1.3 to emulate the extremity CBCT scanner<sup>49</sup> and test bench setup. The x-ray spectrum at the detector,  $q_{det}(E)$ , was obtained from the input spectrum,  $q_0(E)$ , attenuated by material approximating a human knee: 8 cm water, 7.6 cm spongiosa and 0.4 cm cortical bone. To investigate the effects of system geometry in hypothetical future system designs, additional geometries with varying magnification were simulated by holding SAD fixed and varying SDD. Tube output was kept the same in all configurations so that the patient dose was constant.

## 2.B. Experimental setup

Experimental evaluation of CMOS-based extremity CBCT was performed on an imaging test bench (Fig. 2). Two CMOS detectors (Xineos-3030HR, Teledyne DALSA, Eindhoven, NL) were tested, one with CsI:Tl thickness of 0.4 mm (C400) and one with thickness of 0.7 mm (C700). The detectors have a  $30 \times 30 \text{ cm}^2$  FOV, pixel size of  $0.099 \times 0.099 \text{ mm}^2$ , 14-bit digitization, and frame rate of up to 30 fps for full resolution readout. The scintillators are deposited on fiber-optic plates made with lead glass. The same set of experiments was performed with both detectors, keeping the geometric configuration and acquisition parameters fixed to provide head-to-head performance comparison for two CsI:Tl thicknesses. The detectors were operated in high-full-well sensitivity mode.

The test bench employed an IMD RTM 37 rotating anode x-ray source (IMD, Grassobbio, IT) with 3 kW power and nominal focal spot of 0.3 FS (IEC336). The beam energy in all experiments was 90 kV (0.2 mm Cu + 2 mm Al added filtration). The SDD was fixed at ~560 mm and the SAD was ~430 mm, consistent with the geometry of a clinical extremity CBCT developed at our institution.<sup>68</sup> The object to be imaged was rotated using a Velmex B4800 rotation stage (Velmex, Bloomfield, NY), and projections were obtained in a step-and-shoot mode of x-ray pulses synchronized with detector readout.

We observed evidence of possible direct x-ray interaction in the crystalline Si (due to the small fraction of x-rays that were not absorbed in the lead glass of the fiber-optic plate) as bright, single-pixel outliers (“speckles”) apparent after gain and offset corrections. The speckles were isolated by applying a Laplacian filter to select pixels that deviated from the mean of the filtered frame by more than 2 standard deviations. Such speckles identified by filtering (typically accounting for <2% of total pixels) were corrected by linear interpolation of nearest neighbors.

## 2.C. Experimental studies

**2.C.1. Measurement of detector MTF, NPS, and scan dose**—Measurements of detector MTF and NPS were performed with additional 2.5 mm Cu and 2 mm Al placed in the beam to simulate attenuation by 15 cm of water. Detector MTF was measured using a tungsten edge placed on the detector surface and imaged at  $\sim 15^\circ$  angle to the pixel matrix. The exposure was set to deliver  $\sim 90\%$  detector saturation and 100 frames were acquired, gain and offset corrected, and averaged. An oversampled edge-spread function (ESF) was obtained from the projection of the tilted tungsten edge following Samei *et al*<sup>69</sup>. The ESF was oversampled at 20  $\mu\text{m}$  intervals via bilinear interpolation, and the LSF was computed by numerical differentiation of the ESF. The presampling detector MTF was obtained as the absolute value of a Fourier transform of the LSF, divided by a sinc function corresponding to the 20  $\mu\text{m}$  binning.

The parameters of the scintillator blur model  $T_3(u, v; t_{CsI})$  in Eq. (8) were estimated by a least-squares fit to the measured MTFs of the two detectors (denoted  $MTF_{C400}$  for the C400 sensor and  $MTF_{C700}$  for the C700 sensor):

$$(A^*, B^*, H_{400}^*, H_{700}^*) = \arg \min_{A, B, H_1, H_2} \left[ \left( T_3|_{A, B, H_{400}} - \frac{MTF_{C400}}{T_5 T_{Ktot400}} \right)^2 + \left( T_3|_{A, B, H_{700}} - \frac{MTF_{C700}}{T_5 T_{Ktot700}} \right)^2 \right] \quad (17)$$

where  $T_{Ktot400}$  and  $T_{Ktot700}$  are the K-fluorescence blur functions for the two CsI thicknesses computed from Eq. (9). The dependence of  $T_3$  on CsI:Tl thickness is encapsulated in the function  $H(t_{CsI})$  in Eq. (8), assumed to follow a polynomial of the form

$H(t_{CsI}) = h_1 \cdot t_{CsI}^2 + h_2 \cdot t_{CsI}$ . The values of the function  $H(t_{CsI})$  at the CsI:Tl thicknesses of the two detectors,  $H_{400}$  and  $H_{700}$ , were obtained through the fit in Eq. (15). The parameters of the polynomial model  $h_1$  and  $h_2$  were estimated from  $H_{400}$  and  $H_{700}$  by an additional fitting step, resulting in the thickness-dependent  $H(t_{CsI}) = 0.35t_{CsI}^2 + 0.18t_{CsI}$ . The factors  $A^*$  and  $B^*$  were found to be 0.20 (unit-less) and 1.42  $\text{mm}^{-1}$ , respectively.

NNPS was computed for detector exposure ranging from 0.019–0.15 mAs/frame (from 3 ms/frame to 24 ms/frame at 6.3 mA). One hundred projections were obtained at each exposure, offset-corrected using a mean of 50 dark images and normalized by the mean of all air projections. Ninety-nine difference images (denoted  $\Delta I$ ) were then obtained from pairs of consecutive frames to remove residual structure or low-frequency trends. Effects of detector lag were assumed negligible based on manufacturer specification of 1<sup>st</sup> frame lag of 0.1%.<sup>70</sup> In each difference image, 144 non-overlapping regions of interest (ROIs) of  $81 \times 81$  pixels were drawn. The NNPS was given by:

$$NNPS = \frac{a_{pix}^2}{2n^2N} \sum_N |FFT[\Delta]|^2 \quad (18)$$

where  $n$  is the ROI size,  $N$  is the total number of ROIs across all difference images, and the factor of 2 accounts for the use of difference images. DQE was computed as:

$$DQE = \frac{MTF^2}{Q_{det} \cdot NNPS} \quad (19)$$

The x-ray fluence  $\overline{Q_{det}}$  was obtained from Spektr simulation using the source model described in Sec. 2.A.

Dose measurements were performed using three 16 cm diameter CTDI phantoms stacked to cover the longitudinal FOV of the benchtop CBCT. A Farmer chamber (AccuDose, Radcal Corp., Monrovia CA) was placed at the center of the x-ray beam in the central hole of the CTDI phantom. The central CTDI dose per projection was obtained by averaging 110 static exposures of the CTDI phantom for x-ray techniques ranging 0.032–0.16 mAs/exposure (from 5 ms/frame to 25 ms/frame at 6.3 mA).

**2.C.2. Cadaver Study**—CBCT scans of a cadaver knee were acquired using 420 projections evenly distributed over  $220^\circ$  (equal to  $180^\circ + \text{fan angle}$  and thus providing complete sampling). The x-ray technique was varied from 0.038 – 0.15 mAs/frame (from 6 ms/frame to 24 ms/frame at 6.3 mA). Image reconstruction used the Feldkamp algorithm with a Hann-apodized filter and Parker short scan weights<sup>71, 72</sup>. For high-resolution bone reconstruction, the filter cutoff was 0.9 of the Nyquist frequency ( $f_{Nyq}$ ) and voxel size was 0.025 mm. Soft tissue reconstruction involved  $4 \times 4$  software projection binning, filter cutoff at  $0.8 \times f_{Nyq}$ , and 0.3 mm voxel size. Scatter correction was performed assuming that the scatter in each projection view is uniform and equal to a fraction of the mean projection value (empirically set to 0.4) in a  $5 \times 5$  pixel ROI at the center of the projection.

### 3. RESULTS

#### 3.A. Detectability index for extremity CBCT

Figure 3 presents the evaluation of task-based detectability with respect to detector pixel size, electronic noise, and scintillator thickness. The nominal extremity CBCT scanner geometry was assumed. Recognizing the multi-dimensional character of this evaluation, a set of two-dimensional optimizations holding other parameters fixed at nominal values was chosen to summarize key findings. The simulated bare-beam x-ray exposure was 0.126 mAs/projection. Based on Farmer chamber measurements (Sec. 2.C.1), the central CTDI scan dose  $D$  for this exposure is estimated to be 15 mGy (assuming 420 projections/scan). This value is within the typical dose range for scan protocols in FPD-based extremity CBCT.

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Figure 3A shows relative detectability for a CMOS detector with  $t_{CsI} = 0.7$  mm as a function of detector pixel size and task. For each task, detectability was normalized by the maximum detectability for that task across all values of  $a_{pix}$ . The model of focal spot blur was not included in this analysis to elucidate the impact of detector parameters. The optimal pixel size, indicated with a dashed line in Fig. 3A, varies from 0.07–0.11 mm across the investigated range of  $a_{obj}$  (0.03–0.2 mm), with smaller feature size favoring smaller  $a_{pix}$ .

Figure 3B shows the performance of a hypothetical a-Si:H FPD assumed identical to the CMOS detector except for  $5\times$  increased electronic noise. At each value of  $a_{obj}$ , the detectability values across all values of  $a_{pix}$  were normalized by the maximum detectability attained by the CMOS detector for the same task. The optimal pixel size for any feature size is larger for the a-Si:H FPD than for CMOS, compensating the increased contribution of electronic noise. For coarse features, this increased  $a_{pix}$  has only a minor effect on the maximum detectability, which is comparable to that achieved with the CMOS. However, for small feature sizes corresponding to imaging tasks in trabecular bone (0.05–0.1 mm), the maximum detectability of the a-Si:H FPD is only 20%–60% of the maximum  $d^2$  of the CMOS. Due to its lower electronic noise, a CMOS detector is able to better exploit the increased Nyquist frequency and the improved aperture MTF ( $T_5$ ) associated with reduced pixel size, resulting in better performance in high-resolution tasks.

Based on Fig. 3A, the pixel size of the CMOS sensor used in the experimental studies ( $a_{pix} = 0.099$  mm) is seen to provide optimal or nearly optimal performance for a broad range of feature sizes. In Fig. 3C, the pixel size was thus fixed at 0.099 mm to investigate the effects of scintillator thickness. The detectability for each  $a_{obj}$  was normalized by their maximum value across the investigated range of  $t_{CsI}$ . For small feature size, the improvement in spatial resolution provided by a thin scintillator compensates for the increase in quantum noise resulting from reduced QDE (see Sec. 2.A and Fig. 2B), and optimal  $d^2$  is achieved at CsI:Tl thickness of  $\sim 0.4$  mm for  $a_{obj}$  of  $\sim 0.07$  mm. As the feature size increases, there is less benefit to the improved MTF provided by thin  $t_{CsI}$ , and the optimal  $d^2$  shifts toward thicker CsI:Tl to minimize quantum noise (increase QDE). Detectability at  $a_{obj}$  of  $\sim 0.13$  mm is optimized for CsI:Tl thickness of  $\sim 0.7$  mm, typical for current FPD and CMOS detectors for CBCT applications. This scintillator thickness delivers a balanced performance over a broad range of feature size, achieving  $d^2$  within  $\sim 10\%$  of its maximum value (obtained at optimized  $t_{CsI}$ ) for  $a_{obj}$  from 0.08 – 0.2 mm. Using a thin scintillator benefits high-frequency tasks, but results in a relatively steep decline in detectability for coarse features ( $\sim 20\%$  reduction compared to the value at optimized thickness). This effect, however, can be partly mitigated by additional projection binning and filtering to generate a lower resolution “soft-tissue” image separate from the full resolution “bone” reconstruction.

In Fig. 3D, the detectability for fine feature size ( $a_{obj} = 0.06$  mm) consistent with visualization of trabecular bone is analyzed as a function of  $t_{CsI}$  and  $a_{pix}$ . Recognizing that different diagnostic tasks may be sensitive to features of different size, we chose 0.06 mm (as measured in the object domain in the nominal extremity CBCT geometry) as representative of the lower range of typical human trabeculae in Ref. 28 (0.05 mm – 0.2 mm thick). The values of  $d^2$  are normalized to the maximum over the investigated range of  $t_{CsI}$  and  $a_{pix}$ , achieved at  $\sim 0.075$  mm detector pixel size and  $\sim 0.35$  mm CsI:Tl thickness. The

dashed line marks the optimal scintillator thickness for each  $a_{pix}$ . Consistent with Fig. 3A, a pixel size of 0.05–0.1 mm is favored across the entire range of  $t_{CsI}$ , providing an optimal tradeoff between noise (increasing for smaller pixels) and aperture size and Nyquist frequency (improving with smaller pixels). There is a sharp drop in detectability at pixel size  $>0.1$  mm, approximately corresponding to the magnified feature size. The relative benefit of using small  $a_{pix}$  is diminished for thicker  $t_{CsI}$ , where scintillator blur dominates the MTF. For the pixel size of current CMOS sensors (0.05–0.1 mm), the detectability for 0.06 mm feature size is maximized using CsI:Tl thicknesses of  $\sim 0.4$  mm. The optimal thickness is relatively constant for pixels in the 0.05–0.1 mm range (despite the 2-fold change in  $a_{pix}$ , indicating diminishing benefits of improved scintillator sharpness compared to the increase in quantum noise (reduction in QDE). For the CMOS detector used in the experimental studies ( $a_{pix} = 0.099$  mm), a  $\sim 20\%$  improvement in  $d^2$  is anticipated at the optimal CsI thickness of  $\sim 0.35$  mm compared to the commonly employed  $\sim 0.7$  mm CsI. Beyond  $a_{pix}$  of  $\sim 0.1$  mm, the optimal  $t_{CsI}$  changes almost linearly with pixel size, indicating that once the system resolution drops below this value, the optimization of  $d^2$  is driven primarily by reduction of projection quantum noise attained using thicker scintillators.

Figure 4 uses the theoretical system model of Sec. 2.A to investigate effects of imaging dose, focal spot size, and system geometry in CMOS-based extremity CBCT. The ratio of  $d^2$  of a CMOS detector with 0.099 mm pixels and  $t_{CsI} = 0.4$  mm (C400) to  $d^2$  of the same detector with  $t_{CsI} = 0.7$  mm (C700) is shown in Figure 4A for the nominal extremity CBCT system geometry. A dose range typical of extremity imaging is considered (5 – 30 mGy central CTDI scan dose). The  $d^2$  ratio is fairly independent of dose over a broad range. A thin scintillator is preferred for feature size  $< 0.1$  mm, and a slight change in relative detectability of the two detectors occurs at very low dose (likely below practical imaging dose levels) and is due to the effects of electronic noise. At such low dose, the electronic noise terms favor the detector with an even thinner scintillator.

The current FPD-based extremity CBCT scanner implements a stationary anode x-ray source with a 0.5 FS (IEC336). Clinical protocols use  $2 \times 2$  detector binning with 0.388 mm pixels to maintain a  $\sim 30$  sec scan time. In this configuration, there is little benefit from using a smaller focal spot, since detector blur associated with relatively large pixels then dominate the system MTF.<sup>49</sup> A CMOS detector provides finer pixels (with similar or faster scan time), motivating reconsideration of the optimal x-ray focal spot size. Fig. 4B shows the detectability for a 0.06 mm feature size as a function of pixel size and focal spot size. To enable comparison with the current system, CsI:Tl thickness of 0.7 mm was assumed (as in the a-Si:H FPD sensor) and  $d^2$  at each  $a_{pix}$  was normalized by the value at  $a_{spot} = 0.5$  mm. For  $a_{pix} = 0.1$  mm, the system MTF is dominated by source blur at  $a_{spot} = 0.5$  mm, and a  $2 \times - 2.5 \times$  improvement in  $d^2$  can be achieved by adopting an x-ray source with a focal spot of 0.2 – 0.3 mm. The benefits of smaller  $a_{spot}$  are less pronounced for pixel size  $> 0.25$  mm used in the current extremity CBCT (typically 0.139 mm pixel size).

The selection of the x-ray source for benchtop experimentation and implementation on the CMOS-based prototype balanced the need for small focal spot against design requirements such as x-ray power ( $< 1$  kW) and the size of the x-ray unit able to fit inside the CBCT gantry. Based on these considerations, the compact ( $\sim 40 \times 20 \times 30$  cm<sup>3</sup>) rotating anode IMD

RTM 37 tube with 0.3 FS (IEC336) was chosen after survey of commercially available systems.

Figure 4C expands the investigation of CMOS detector configurations to hypothetical system geometries that differ from the current extremity CBCT system in terms of system magnification. Pixel size and scintillator thicknesses yielding optimal  $d'{}^2$  for a 0.06 mm feature size are shown for a range of focal spot sizes (each  $a_{spot}$  is one line) and magnifications (each  $M$  is marked as a data point). Since the x-ray exposure was kept constant at 0.126 mAs/projection (as in Fig. 3), the fluence on the detector decreases with  $M$ . At  $M=1.1$ , the impact of source blur is minimized and the detector fluence is high, and thus the optimization is primarily driven by detector resolution. This results in the same optimal configuration with  $t_{CsI}$  of  $\sim 0.3$  mm and  $a_{pix}$  of  $\sim 0.65$  mm for all focal spot sizes. As the magnification increases, the detector input dose decreases, but the resolution requirements for the task diminish because the feature is magnified. The net result is that detector MTF becomes less of a factor at higher magnifications and the optimization shifts towards thicker CsI:Tl and larger pixel sizes to counteract the loss of input quanta. This effect is most noticeable for the focal spot of 0.5 mm (dash-dot line), where source blur dominates at high magnifications and  $d'{}^2$  is primarily driven by reduction in quantum noise with thicker scintillators and larger pixels. For  $a_{spot}$  of 0.2 mm (solid line), on the other hand, system MTF is not as strongly affected by focal spot blur. The optimal detector configuration appears to be still partly driven by system resolution, favoring thinner CsI:Tl than for larger focal spots. Configurations with  $a_{spot}$  of 0.3 mm (dashed line consistent with the source used in experimental studies) represent a somewhat intermediate case. For magnifications of up to 1.3, the optimal  $a_{pix}$  and  $t_{CsI}$  are similar to those for focal spot of 0.2 mm. At those magnifications, the system MTF is dominated by detector blur for both x-ray focal spots. (Note that the optimal configurations at  $M=1.3$  agree well with the optimum in Fig. 3D, where source blur was not included in the simulation). As  $M$  increases above 1.3, source blur becomes more prominent and the optimization switches toward using thicker scintillator and larger pixels to improve the noise component of  $d'{}^2$ . In all cases, the diminishing need for high spatial resolution due to magnification of the feature of interest allows for substantial increase in optimal  $a_{pix}$  and  $t_{CsI}$  at high values of  $M$ .

Figure 4D shows the detectability as a function of  $M$  and  $t_{CsI}$  for the optimal detector configurations identified in Fig. 4C. The detectabilities are normalized by the optimal value at the nominal CBCT configuration and  $a_{spot}$  of 0.3 mm. Consistent with Fig. 4B,  $d'{}^2$  generally improves with decreasing focal spot size. However, the detectability at optimal detector configuration decreases with increasing  $M$ . Despite the diminishing resolution requirements at high magnifications, the increase in optimal  $a_{pix}$  and  $t_{CsI}$  required to compensate for the loss of input quanta associated with long SDDs leads to an unfavorable tradeoff between system MTF and NNPS. The resulting decrease in  $d'{}^2$  is especially pronounced at  $a_{spot}$  of 0.5 mm, where system resolution is increasingly dominated by source blur at high values of  $M$ . For fixed source output and patient dose, configurations with smaller magnification and thus improved detector input fluence are preferred for the high resolution tasks considered in this work.

### 3.B. Experimental evaluation

Figure 5A shows MTF measurements for the C400 and C700 configurations. The frequency at 50% modulation ( $f_{50}$ ) is  $\sim 1.4\times$  higher for the detector with thinner scintillator. Solid lines indicate empirical fits to detector MTF used in the cascaded systems model (Eqs. 7, 8 and 17). The parameterization of  $T_3$  in Eqs. 8 and 17 appears to adequately capture the thickness-dependent component of scintillator blur, as indicated by good quality of the fit for both configurations. Superior spatial resolution of the C400 is confirmed in Fig. 5B, which show images of a Gammex 91437 (Gammex, WI) radial resolution gauge placed on the surface of each detector (mean of 50 frames acquired at 6.3 mA and 20 ms). Compared to C700 (left panel), C400 (right panel) maintains modulation of the line pattern (i.e., is free from signal aliasing) up to higher spatial frequencies.

Fig. 6 shows measured DQE for the two detectors (points) along with simulated DQE obtained from the cascaded systems model (lines). DQE is presented for two values of detector entrance dose in the quantum-limited range and at a low entrance dose of  $\sim 0.5$  mGy/frame, where the impact of electronic noise becomes visible at high frequencies. (All doses were measured behind additional filtration emulating attenuation by 15 cm water; see Sec. 2.C.1). The C700 outperforms C400 for spatial frequencies up to  $\sim 3$  mm $^{-1}$ , where the DQE of both detectors begins to converge, indicating a regime where the improved MTF of the C400 detector overcomes the elevated noise (reduced QDE) associated with the thinner scintillator. Near the Nyquist frequency, C400 achieves better DQE than C700 for all considered dose levels (0.127 for C400 vs 0.069 for C700 at 0.470  $\mu$ Gy/frame; 0.117 vs 0.057 at 0.293  $\mu$ Gy/frame; 0.049 vs 0.017 at 0.045  $\mu$ Gy/frame). The noise-equivalent dose, the dose at which quantum noise reaches the same magnitude as electronics noise<sup>73</sup>, is  $\sim 0.03$   $\mu$ Gy/frame.

We observed fair agreement between simulated and measured DQE. Most significant discrepancies were observed at low frequencies for the C700 detector, likely due to inaccuracies in estimation of packing fraction  $f_{CSJ}$  and K-fluorescence reabsorption blur  $T_k$ . Since direct measurements of those parameters for the two sensors were not available, their implementation in the model were based on approximations, namely: the same value of  $f_{CSJ}$  was used for C400 and C700, chosen empirically to yield fair agreement with measured NNPS(0) for both detectors; however, a better overall fit in DQE could be potentially achieved by adjusting the packing fraction individually for each detector. With respect to  $T_k$ , the model uses an analytical formula adapted from the work of Que *et al*<sup>60</sup>. The impact of  $T_k$  in the total K-fluorescence MTF  $T_{ktot}$  (Eq. 9) becomes negligible at  $\sim 3$  mm $^{-1}$ , reflecting the relatively long range of K-fluorescence photons. This implies that potential inaccuracies in the analytical estimate of  $T_k$  (originally derived for amorphous selenium) are most likely to affect low- to mid- frequency DQE. Further refinement of the estimates of  $f_{CSJ}$  and  $T_k$  requires dedicated experimental techniques and more sophisticated scintillator models (e.g., Monte Carlo simulations<sup>74, 75</sup>) that are beyond the scope of this study. In the present work, the impact of these approximations is limited because we are primarily concerned with tasks emphasizing mid- to high-frequencies ( $>2$  mm $^{-1}$ ), where the simulation agrees well with measurements.



### 3.C. Cadaver Imaging

Reconstructions of a cadaveric knee obtained using the C400 and C700 configurations are shown in Figure 7. The central CTDI dose was 15 mGy in both scans.

Figure 7A shows details of two trabecular regions in high resolution bone reconstructions of the knee. The images in the top row of Figure 7A were generated using the high-resolution reconstruction protocol, but after digital  $2 \times 2$  pixel binning of C700 projections to mimic the  $\sim 0.2$  mm pixels of a-Si:H FPDs operated at full resolution. Comparison with images obtained using C700 and the native pixel size of 0.1 mm in the center row of Fig. 7A reveals the improvement in visualization of trabecular detail enabled by the fine pixel size of CMOS detectors.

Bone protocol reconstruction of projections acquired using the custom CMOS with 0.4 mm CsI:Tl are presented in the bottom row of Figs. 7A (trabecular regions of interest) and 7B (complete axial slice). Adoption of a thin scintillator further enhances the visibility of the trabecular pattern compared to C700. As expected based on the simulation studies, where the increase in  $d^2$  with C400 was  $\sim 10$ – $20\%$ , the improvement in visualization of high frequency detail is perceptible, but modest, and accompanied by slightly increased noise. This increased noise might affect visualization of low contrast soft-tissue structures. However, since very high spatial resolution is not essential in soft tissue evaluation, the impact of elevated noise can be mitigated at least in part by binning the projections, using larger voxels and adjusting the reconstruction filter. As shown in Fig. 7C, soft-tissue reconstructions obtained using C400 and the soft-tissue protocol with  $4 \times 4$  digital binning (Sec. 2.C.2) achieve adequate visualization of soft-tissues.

## 4. DISCUSSION AND CONCLUSIONS

Analysis of task-based detectability points to the benefits of CMOS detectors in high-resolution applications of extremity CBCT. A CMOS detector was found to achieve  $\sim 4 \times$  better detectability for 0.06 mm features compared to an otherwise identical detector ( $a_{pix} = 0.1$  mm) that exhibited electronic noise comparable to an a-Si:H FPD. This is because the low electronic noise of CMOS detectors allows the system to take advantage of smaller apertures and improved sampling associated with fine detector pixels. Pixel size  $< 0.1$  mm was preferred for all tasks considered ( $a_{obj} = 0.03$  to 0.2 mm). In addition to higher spatial resolution, CMOS detectors offer 3– $4 \times$  faster frame rate than a-Si:H FPDs. Scan times of 20–30 sec are anticipated for CMOS-based extremity CBCT operated at full detector resolution, reducing the risk of patient motion during acquisition.

Since the optimal pixel size for high-frequency tasks is smaller for CMOS detectors compared to a-Si:H FPDs, such applications also benefit from using a scintillator that is thinner than the 0.6–0.7 mm CsI:Tl that is commonly employed. In simulation studies, a  $\sim 0.4$  mm scintillator was shown to provide 10–20% better detectability for high-frequency tasks compared to a 0.7 mm scintillator for conditions typical of extremity CBCT. DQE measurements of CMOS detectors with 0.4 mm CsI (C400) and 0.7 mm CsI (C700) showed that while C700 showed better DQE at low frequencies, C400 provided improved DQE at frequencies  $> 3$  lp/mm. CBCT imaging of a cadaveric knee confirmed a modest but

perceptible improvement in delineation of trabecular detail with the custom CMOS detector with 0.4 mm CsI:Tl.

The decrease in DQE and detectability for low-frequency tasks may hamper soft-tissue imaging in a system based on a detector with thin scintillator. However, software binning of projection data obtained with C400 at imaging dose of 15 mGy yielded adequate delineation of soft-tissues (muscles, tendons, and fat). Overall, the prototype CMOS detector with 0.4 mm scintillator provided improved performance in imaging of trabecular bone compared to a conventional screen without major detriment to soft-tissue visualization.

The results discussed above were obtained assuming the geometry of current generation extremity CBCT. This compact configuration was developed specifically to enable weight bearing imaging of a single extremity. The primary constraint resulting from this consideration is that the detector needs to rotate between the legs of the subject, limiting system magnification. It is interesting to consider potential benefits of other system configurations, free of this restriction. To this end, additional study was performed to analyze the impact of altering the magnification by increasing the SDD and keeping the SAD constant. The current value of SAD (~400 mm) cannot be significantly shortened in a realistic system configuration considering spatial constraints (size of the extremity and the collimator box) and the available x-ray source cone angles. When x-ray source output and patient dose are kept constant and SDD (and thus magnification) is increased, the detectability is generally maximized at thicker CsI and larger pixel sizes. This is partly because larger magnifications exhibit somewhat reduced demands on detector resolution, allowing the optimization to be driven by noise reduction. However, the detectability at optimal detector configurations decreases with  $M$ , indicating that the overall tradeoff between system MTF and NPS still favors configurations with high enough input fluence to allow using thin scintillators and small pixels to minimize detector blur.

The tradeoffs associated with system magnification would be different in a study where the source output was adjusted to yield constant detector input fluence across all detector configurations. Under such conditions, systems with higher magnification would likely be favored since the optimization would not contend with the loss in input quanta. However, the constraint of fixed source output is a reasonable starting point with respect to fixing the dose to the patient. This is not only due to patient safety considerations, but also because of the limited power available in x-ray tubes with focal spot sizes small enough (0.2 mm) not to dominate system resolution at high magnifications.

There are recognized limitations of the CMOS detector model. A slight discrepancy between simulated and measured DQE was attributed primarily to inaccuracy in the model of K-fluorescence blur.<sup>60</sup> This discrepancy is unlikely to influence the general conclusions, in particular with respect to medium and high-frequency tasks where there was good agreement between simulation and measurement. Furthermore, the thickness-dependent model of scintillator MTF was parameterized based on measurements on C400 and C700. This parameterization may include effects unrelated to scintillator blur, such as differences in optical coupling between the two sensors. The thickness of the scintillators is also not exactly known and subject to manufacturing tolerances. Nevertheless, we believe that the

model properly captures general trends associated with reduced scintillator thickness, as confirmed in experimental studies with the two detectors.

The task model in the current work represents discrimination of two stimuli by an NPW observer. It is recognized that this choice may not exactly represent the performance of a computer algorithm in quantitative analysis of bone quality. Rather, it is intended as a reasonable approximation of the fundamental capability of the system to resolve high resolution details, under an assumption that any improvement in this capability will likely benefit the analysis of trabecular microstructure. Conventionally, such analysis involves thresholding and binarization to extract the bone voxels and measure structural indices,<sup>76</sup> which may be more closely related to estimation tasks than detection/discrimination tasks.<sup>77</sup> It is anticipated that improved system performance in the discrimination task will translate also to improved performance in the threshold-based quantitative measurements. A potentially more challenging extension of this work might involve predicting the performance of a texture classification algorithm applied to trabecular regions.<sup>78–81</sup> The investigation of textural biomarkers of bone quality is still in early stages and there is no consensus yet as to which of the textural features are best suited for diagnostic applications. For some features, such as those based on the grey-level co-occurrence matrix,<sup>82</sup> improved conspicuity of fine trabecular detail may improve the sensitivity of classification. However, it is possible that other textural features may be less sensitive to this aspect of system design. Overall, new task functions and observer models specific to the features of interest will need to be developed to enable task-based analysis of textural biomarkers. Such development is beyond the scope of this work.

Finally, the optimization studies were performed in projection domain to focus the analysis on the fundamental aspects of imaging performance. Achieving best possible baseline imaging capability, as reflected in the 2D metrics evaluated in this work, is an essential first step in the development of the new capability for high resolution analysis of bone microstructure. Numerous practical design considerations, more amendable to analysis using models of 3D imaging performance, were not investigated. Such considerations include x-ray scatter, shift-variant x-ray source blur, blur due to gantry motion in continuous pulsed acquisition and reconstruction algorithm.

The current generation extremity CBCT relies on algorithmic scatter correction methods<sup>83–85</sup> to achieve adequate soft tissue contrast despite the relatively high SPRs of ~0.5–1.<sup>84</sup> Previous work indicated however a modest benefit in contrast-to-noise ratio (CNR) from an anti-scatter grid in extremity CBCT geometry.<sup>84</sup> Ongoing work on a prototype CMOS-based system will determine whether the improvement in CNR due to a grid translates to improvement in quantitative metrics of bone microstructure and whether such benefit outweighs potential practical challenges in calibration and grid line artifact correction.

A fairly general, simplified model of x-ray focal spot was used in this work. This model was not intended to simulate any particular x-ray tube, but to provide an adjustable model to investigate “first-order” effects of source blur. This approach assumes that the blur is isotropic and shift-invariant. In practice, neither of those assumptions is perfectly satisfied.

Pinhole measurements<sup>86</sup> of the focal spot on the RTM37 tube used in this work revealed a complex, non-isotropic shape with full width at half maximum (FWHM) of ~0.2 mm in the cathode-anode direction, close to the stated nominal value. In systems that are not dominated by focal spot blur, such as the proposed CMOS CBCT using ~0.1 mm detector pixels, the shape of the focal spot is unlikely to have substantial impact on system resolution. A potentially more significant effect is the variation in the apparent focal spot size seen in different areas of the detector. For the extremity CBCT geometry, the apparent focal spot width for a 0.3 mm x-ray source is ~0.16 mm at the edge of the 300 mm detector on the cathode side of the source, ~0.1 mm at the center and ~0.025 mm on the anode side. Inside a projection view of ~100 mm diameter object (e.g. human tibia), the apparent focal spot varies from ~0.12 mm on the cathode side to ~0.06 mm on the anode side. In 3D imaging, magnification changes throughout the field of view, resulting in even more complex combination of shift variant source and detector blurs, additionally affected by angular sampling and the imaging orbit (short or full scan). A study evaluating local 3D imaging performance in the presence of shift variant blurs was recently reported.<sup>86</sup> An extremities CBCT system with 0.3 mm focal spot size, 0.1 mm detector pixels, and short scan acquisition was simulated using a geometric forward projection model. Fidelity of Feldkamp reconstruction of a trabecular bone phantom was assessed throughout the field of view using Root Mean-Squared Error (RMSE). There was ~7% change in RMSE between the best and worst values. Interestingly, the short scan orbit provided a potential advantage over a full scan in that a region of the field of view was sampled primarily by the cathode side of the source, thereby improving local resolution. Overall, however, the fidelity of the reconstruction was only slightly affected by the shift variant source blur, likely because detector blur dominates in this system geometry.

Another practical consideration not investigated in this study is the effect of continuous gantry rotation. Assuming that the Xineos3030 detector is operating at 30 fps, the total scan time for the 210° trajectory will be ~17 seconds. For 5 ms x-ray pulse length (attainable by the RTM37 tube used here), the distance travelled by an object at the radius of 50 mm from the axis of rotation is 0.055 mm/pulse. After considering system magnification, this distance is less than the pixel size. The resulting motion blur is thus minimal, but detailed investigation of this effect is left to experimental studies on a prototype scanner.

Future work will involve optimization of reconstruction algorithms for trabecular imaging. Of particular interest are novel model-based iterative reconstruction (MBIR) algorithms<sup>87</sup> incorporating models of system blur<sup>88</sup>. Such algorithms are able to account for noise correlations due to blur,<sup>88</sup> to incorporate shift-variant source blur<sup>86, 89</sup> and potentially to model blur due to gantry rotation. This may improve trabecular imaging by achieving resolution recovery with better resolution-noise properties than using standard deblurring methods.

Based on this study, the custom CMOS detector with 0.4 mm scintillator and the compact rotating anode x-ray source with 0.3 mm focal spot have been translated to the gantry of an extremity CBCT system (OnSight 3D) to develop a prototype high-resolution scanner for clinical studies. Parallel work involves development of motion correction<sup>90, 91</sup> and advanced reconstruction algorithms with model-based deburring to further enhance system resolution

discussed above.<sup>88</sup> Evaluation against gold-standard micro-CT in metrics of bone microstructure using bone core samples is ongoing. A clinical pilot study of test-retest reproducibility in bone morphometry in OA patients is in preparation. It is anticipated that the improved performance in high-frequency imaging tasks provided by the CMOS detector will enable robust measurements of bone microarchitecture *in vivo*, benefiting image-based assessment of osteoporosis, osteoarthritis, and monitoring of fracture healing.

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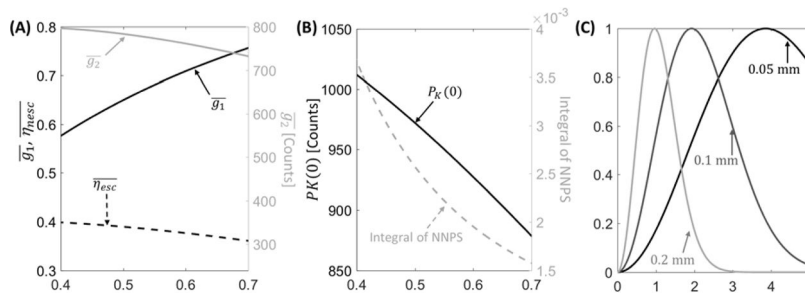
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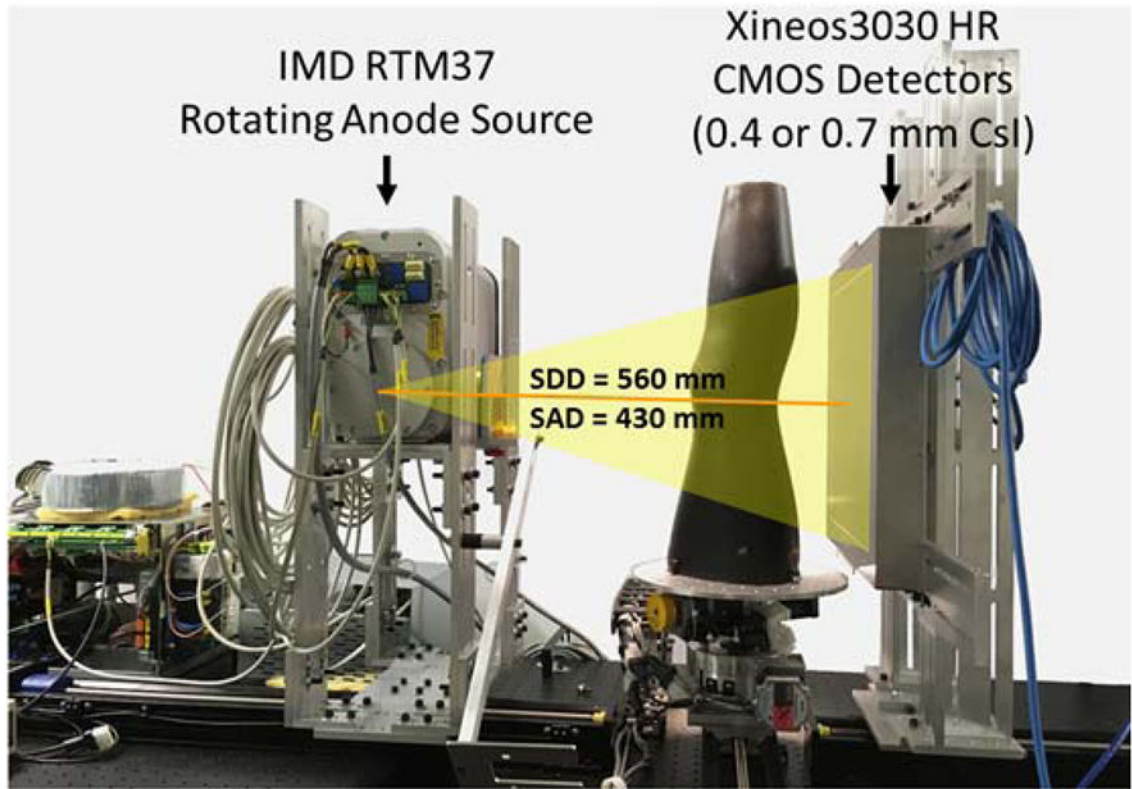
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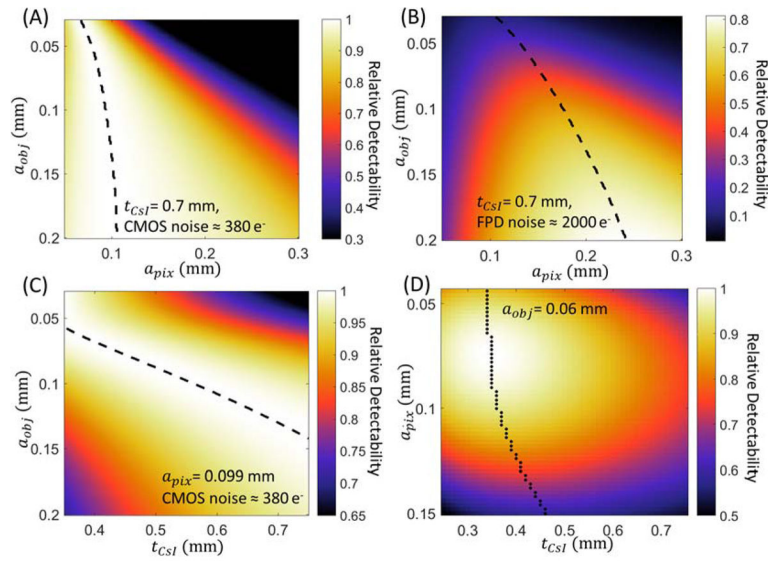
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**Figure 1.** (A) Quantum detection efficiency, escape efficiency (left vertical axis, black lines), and scintillator gain (right vertical axis, gray line) computed as a function of scintillator thickness. (B) Zero-frequency  $P_K$  and integral of detector NNPS over the Nyquist frequency range (gray line) as a function of CsI thickness. (C) Examples of task functions (Eq. 13, assuming  $C=1$ ) for three feature sizes: 0.05 mm (solid black line), 0.1 mm (solid dark gray line), and 0.2 mm (solid light gray line). The tasks emphasize distinct frequency bands depending on the underlying feature size.

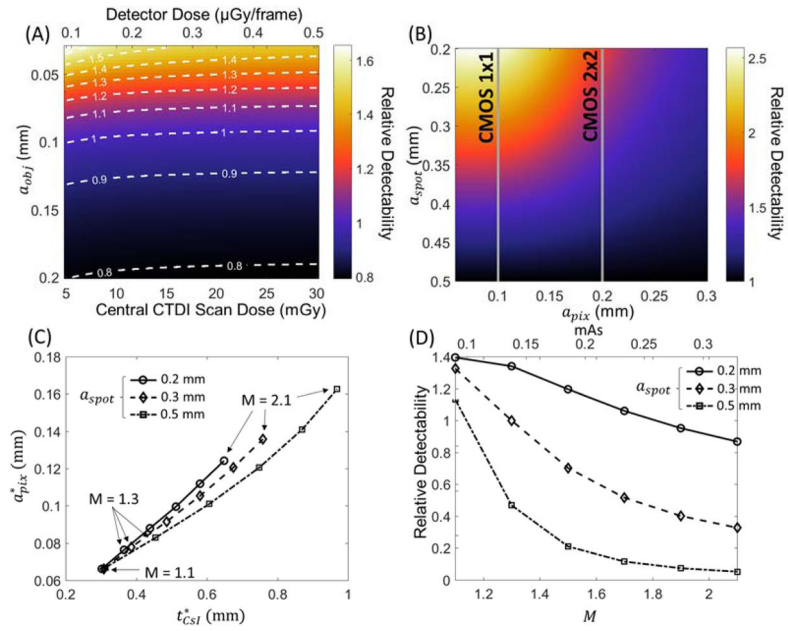


**Figure 2.** CBCT test-bench used in experimental studies. The bench was configured with two CMOS sensors, one with CsI:Tl thickness of 0.4 mm (C400) and one with thickness of 0.7 mm (C700).



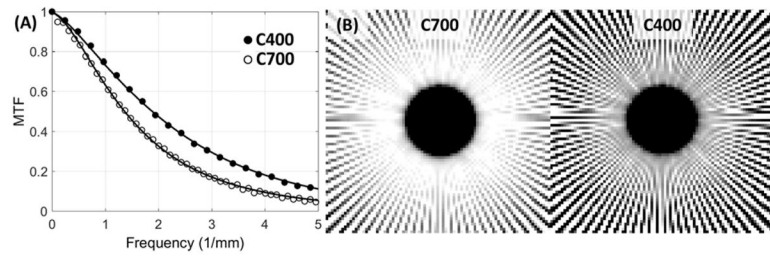
**Figure 3.**

Task-based evaluation of CMOS detector performance in extremity CBCT. (A) Relative detectability for a range of feature sizes (vertical axis) as a function of pixel size. Scintillator thickness is assumed constant and equal to 0.7 mm. Detectability is normalized to the maximum value for each  $a_{obj}$ . Dashed lines indicate maximum  $d'$  for each feature size. (B) Ratio of  $d'^2$  achieved with the same scintillator as (A), but at increased electronic noise consistent with an a-Si:H FPD, to maximum  $d'^2$  attained for each  $a_{obj}$  by the low-noise CMOS detector of (A). (C) Relative detectability of the CMOS detector as a function of scintillator thickness and imaging task, normalized by maximum detectability achieved for each  $a_{obj}$  across the range of  $t_{CSl}$ . Pixel size is 0.099 mm. (D) Joint optimization of pixel size and scintillator thickness for a “trabecular” imaging task with feature size of 0.06 mm. The graph shows detectability of a CMOS detector (normalized by the maximum).



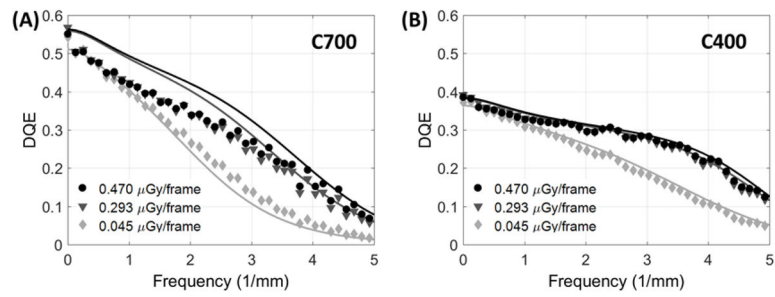
**Figure 4.**

(A) Ratio of detectability achieved with the C400 detector to that of C700 as a function of imaging task and imaging dose for the nominal extremity CBCT geometry. Top horizontal axis represents detector entrance dose (after attenuation by a simulated knee), and the bottom horizontal axis gives the corresponding measured central CTDI dose in a CBCT scan. (B) Detectability for the trabecular imaging task ( $a_{obj}=0.06$  mm) as a function of focal spot size and pixel size, normalized by the detectability achieved for each  $a_{obj}$  using a 0.5 mm focal spot. C700 detector and nominal extremity CBCT geometry are assumed. (C) Pixel size and scintillator thickness yielding optimal detectability for the trabecular imaging task ( $a_{obj}=0.06$  mm) as a function of magnification and focal spot size. (D) Relative detectability values (normalized to detectability at the nominal CBCT geometry and  $a_{spot} = 0.3$  mm) at the optimal detector configurations found in (C).

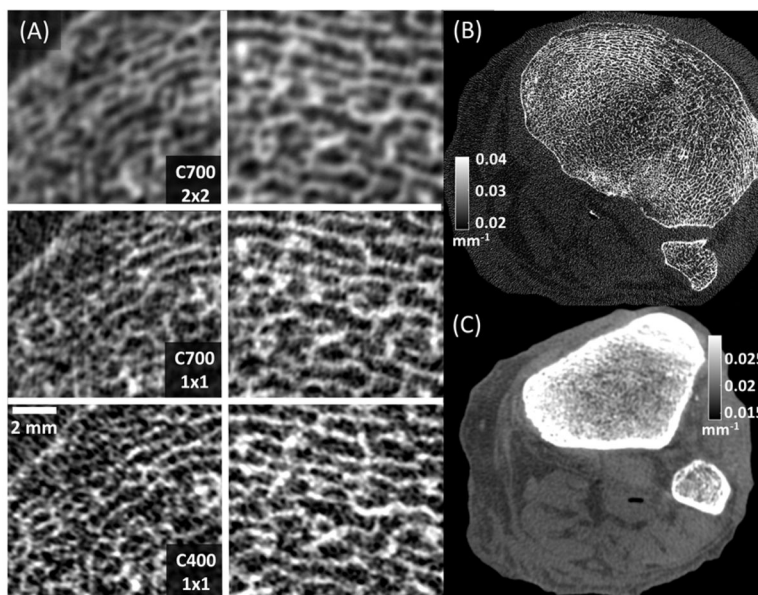


**Figure 5.**

(A) Experimental measurements of detector MTF for CMOS sensors with 0.7 mm CsI:Tl (open circles) and 0.4 mm CsI:Tl (closed circles). Lines represent MTFs computed using the cascaded systems model. (B) Contact images of the GAMMEX 91437 resolution gauge obtained with 0.7 mm CsI:Tl (left) and 0.4 mm CsI:Tl (right).



**Figure 6.** Measured (points) and simulated (lines) DQE for a range of dose levels for the CMOS detector with (A) 0.7 mm thick scintillator and (B) 0.4 mm scintillator.



**Figure 7.**

(A) Magnified views of two trabecular regions in the subchondral bone of a cadaver knee imaged using CMOS detectors with different pixel sizes and scintillator thicknesses. High resolution bone reconstruction was used. (A, top) Reconstructions of 2×2 binned C700 projections, mimicking the pixel size of current a-Si:H FPDs. (A, middle) Reconstructions of C700 projections in 1×1 binning, showing the benefits of reduced pixel size provided by CMOS. (A, bottom) Images acquired with C400 in 1×1 binning, illustrating the visualization of trabecular detail using a thin scintillator. (B) A complete axial slice of C400 reconstruction obtained using high resolution protocol (C) A C400 reconstruction obtained using a soft-tissue protocol with 4×4 pixel binning.



Glossary of terms and symbols in the cascaded systems model. Model constants include fundamental physical quantities, geometry and typical operating parameters of the extremity CBCT system, and detector parameters that are independent of CsI:TI thickness. CMOS detector performance was analyzed as a function of quantities denoted as key variables. The derived quantities are functions of the model constants and key variables; their nominal values are given at two detector thicknesses corresponding to the CMOS sensors used in experimental studies, assuming all other parameters are at their nominal value.

**Table 1**

Constants	Notation	Value	Ref.
Beam energy	$E_{max}$	90 kV	49
Fluence per exposure pre-object	$\overline{q_0}/X$	$2.58 \times 10^5$ x-rays/mR/mm <sup>2</sup>	54
Source-detector distance	SDD	560 mm	50
Source-axis distance	SAD	431 mm	
Total filtration (inh. + added)		3.4 mm Al+0.2 mm Cu	55
Object		8 cm water + 7.3 cm spongiosa + 0.4 cm cortical bone	
CsI density	$\rho_{CsI}$	4.51 g/cm <sup>3</sup>	-
Packing fraction	$f_{CsI}$	0.7	-
K-edge energy	$E_K$	35 keV	
K-fluorescence probability	$\xi$	0.83	56
K-fluorescence yield	$\omega$	0.87	
Work function	$W$	55.6 optical photons/keV	
Coupling efficiency	$\overline{g_4}$	0.59	-
Fill factor	$f_{pix}$	0.85	-
Electronics noise	$\sigma_{add}$	390 e <sup>-</sup>	
Conversion gain	$k$	139 e <sup>-</sup> /ADU	

Key Variables	Notation	Range (nominal value)	Ref.
Dose (mGy)	$D$	15–40 (15)	-
Focal spot size (mm)	$a_{spot}$	0.05–0.7 (0.5)	-
CsI:TI thickness (mm)	$t_{CsI}$	0.35–0.75 (0.7)	-
Pixel size (mm)	$a_{pix}$	0.05–0.4 (0.099)	-
Magnification	$M$	1.1–2.1 (1.3)	-

Derived Quantities	Notation	Nominal Values (at $a_{pix}=0.099$ mm)	Ref.
		@ $t_{CSF}=0.4$ mm @ $t_{CSF}=0.7$ mm	
Focal spot blur	$T_{spot}$	Eq. (10)	-
Quantum detection efficiency	$\overline{g}1$	0.47	0.66
K-fluorescence reabsorption	$f_K$	0.66	0.77
Escape fraction	$\eta_{esc}$	0.40	0.37
Quantum gain (photons/X-ray)	$\overline{g}2$	931.57	854.12
Photodiode aperture (mm)	$a_{pd}$	0.0913	-
Gain (e <sup>-</sup> /Incident x-ray/pixel)	$G$	2.14	2.76
Scintillator blur	$T_3$	Eq. (8)	-
Total K-fluor. blur	$T_{Ktot}$	Eq. (9)	-
Pixel aperture	$T_5$	-	-
Sampling function	$III_6$	-	-