# X-ray performance evaluation of the Dexela CMOS APS X-ray detector using monochromatic synchrotron radiation in the mammographic energy range

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Abstract- Digital detectors based on complementary metaloxide-semiconductors (CMOS) active pixel sensor (APS) technology have been introduced recently in many scientific applications. This work is focused on the X-ray performance evaluation of a novel CMOS APS detector in low energy medical imaging applications using monochromatic synchrotron radiation (i.e. 17-35 keV), which also allows studying how the performance varies with energy. The CMOS sensor was coupled to a Thallium-activated structured cesium iodide (CsI:Tl) scintillator and the detector's X-ray performance evaluation was carried out in terms of sensitivity, presampling modulation transfer function (pMTF), normalized noise power spectrum (NNPS) and the resulting detective quantum efficiency (DQE). A Monte Carlo simulation was used to validate the experimentally measured low frequency DQE. Finally, the effect of iodine's secondary generated K-fluorescence X-rays on pMTF and DQE results was evaluated. Good agreement (within 5%) was observed between the Monte Carlo and experimentally measured low frequency DQE results. A CMOS APS detector was characterized for the first time over a wide range of low energies covering the mammographic spectra. The detector's performance is limited mainly by the detectability of the scintillator. Finally, we show that the current data could be used to calculate the detector's pMTF, NNPS and DQE for any mammographic spectral shape within the investigated energies.

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## I. INTRODUCTION

IGITAL X-ray detectors based on complementary D<sub>metal-oxide-semiconductor</sub> (CMOS) active pixel sensor (APS) technology have been introduced in the early 2000s in medical imaging applications [1], [2]. The term "active", compared to "passive", is used to indicate the presence of at least one source follower transistor in each pixel, which buffers and/or amplifies the accumulated signal [3]. This leads to an improved speed and signal-to-noise ratio (SNR), due to the decreased read noise. Since the early 1990s charge coupled devices (CCD) and flat panel detectors (FPD, also referred to as active matrix flat panel imagers) have been used extensively in medical imaging applications [4]-[7]. CCD detectors have high sensitivity due to high fill factor (almost 100 %) and quantum efficiency, leading to small (down to 25 µm) pixel size (increasing the spatial resolution capability) [6]. Also, CCDs demonstrate very small read noise (around 10-20 electrons (e) root mean square (r.m.s.)) because the charge transfer does not introduce any temporal noise. They also demonstrate marginal pixel-to-pixel and column-tocolumn fixed pattern (or structure) noise. Finally, they exhibit wide dynamic range (usually 65-70 decibels (dB)), linear response, and high image quality in terms of SNR [8], [9]. However, the production cost of CCDs is high, which limits their active area to 2-5 cm<sup>2</sup>. Usually optical lenses, fiber optic plate (FOP) or electro-optic coupling are used to demagnify the light signal and allow coverage of the required X-ray field size in the patient. However, this demagnification stage increases the chance of a secondary quantum sink (arising from a lack of gain at a given conversion stage) to keep image quality within acceptable levels [10]. In other words, a number of optical photons can be lost in the demagnification stage. Moreover, CCDs are serial devices, i.e. the entire signal needs to pass through the same sense node before being read out. This leads to high read noise at high frame rates, limiting the use of CCDs in applications such as computed

tomography (CT), tomosynthesis or fluoroscopy [11]. It should be noted that at low dose levels in fluoroscopy, image intensifier based CCDs are commonly used to enhance image quality by multiplying secondary generated electrons. However, these devices suffer from veiling glare caused by the electrons spread inside the image intensifier tube and visible light photons being scattered on the output optics degrading image contrast [6], [12]. Moreover, electron trajectories inside the tube can be distorted by the earth's magnetic field leading to S - shape distortions in the image [13]. Pincushion and Barrel-type distortions occurring due to inherent limitations of the electron focusing optics can influence the anatomy shape and lead to misdiagnosis in some cases [13]. Finally, CCDs require high power [9] and are susceptible to radiation damage [14].

To overcome the CCD limitations, FPDs have become recently the detector of choice in medical imaging applications. FPDs are high-performing, radiation hard and large area (up to 43 cm x 43 cm for general radiography applications) detectors. However, FPDs have reduced detective quantum efficiency (DQE) at low exposure levels [15], [16], caused by high read noise due to the use of passive pixels [17], [18]. Finally, FPDs at high frame rates show an excess of image lag, ghosting and baseline drifts due to the amorphous structure of silicon (Si) or selenium (Se) [19], [20]. CMOS sensors offer an alternative to CCDs and FPDs due to the potential of radiation tolerance, low-cost mass production, low power consumption [21], and very fast image acquisition due to random pixel addressing capability [22]. Stitching and tilling technologies can be used to obtain large area sensors [18]. Additionally, CMOS sensors demonstrate low read noise at high frame rates due to column parallel read out [23]. The pixel pitch of CMOS sensors (50-100 µm) is smaller compared to that of FPDs (100-130 µm). The fill factor of a typical CMOS APS is around 75-80 % because each pixel contains at least three transistors. The limited fill factor, combined sometimes with modest quantum efficiency, may result in decreased X-ray sensitivity compared to CCDs. However, the relatively low read noise of CMOS APS (around 100-300 e<sup>-</sup> r.m.s.) usually results in high DQE values at low exposure levels. Finally, CMOS sensors suffer from pixel-to-pixel and column-to-column gain variations (or fixed pattern noise) but gain correction (based on flat fielding) can be used to compensate for this. It should be noted that researchers have recently moved towards combining the low read noise, high charge generation, and collection performance of CCDs with fast readout, low power consumption, and high integration capability of the CMOS [23]. In a hybrid CCD/CMOS array, the CCD pixels are connected to a CMOS readout integrated circuit and the column parallel readout architecture overcomes the speed versus noise limitations of a conventional CCD. Nowadays, hybrid CMOS detectors have a limited area (up to around 3 cm x 3 cm) and are used in scientific applications. For instance, hybrid CMOS X-ray detectors have been developed recently for future space-based X-ray telescope missions [24],

[25].

A CMOS-based X-ray detector is an indirect conversion system. In particular, it consists of a CMOS sensor (backend), which is sensitive to visible light photons, optically coupled to a scintillator (front-end) which converts the X-rays to secondary information carriers, i.e. optical photons [6]. The light signal produced by the scintillators increases as a function of the absorbed X-ray energy, leading to energy integrating X-ray detectors. Photon counting detectors, based on cadmium telluride (CdTe) or cadmium zinc telluride (CZT), can be used for medical imaging [26]. They offer high absorption efficiency, spatial resolution, and increased sensitivity because they are direct conversion detectors (i.e. the X-rays are converted directly into electric charge). However, the detector arrays are usually quite small (around 2 cm<sup>2</sup>) and scanning is required for imaging larger objects, resulting in image blurring along the scanning direction. Additionally, long acquisition times may lead to patient discomfort and movement, resulting in further image blurring.

Thallium-activated structured cesium iodide (CsI:Tl) scintillators are widely used in low energy medical imaging applications because they offer high spatial resolution and increased X-ray detectability due to the K-absorption edges of iodine (I) at 33.2 keV and cesium (Cs) at 36.0 keV. It should be noted that X-ray detectors can be either front- or back-side illuminated. In the latter case, the light photons fall on the back-side of the chip preventing loss due to reflections on the metal gates, resulting in almost 100 % fill factor and a substantial increase in quantum efficiency. However, it is difficult to manufacture such detectors because they require wafers uniformly and precisely thinned down to 30 µm or less [27]. Digital X-ray detectors open the way to advances in the state-of-the-art of mammography, such as contrast enhanced digital mammography [28], [29], breast tomosynthesis [30], [31], cone beam CT [32], and others. An important requirement in all cases is the high detectability of X-rays at low dose levels, because for all these methods a sequence of images is acquired. In the current study we used monochromatic synchrotron radiation to measure the X-ray performance of a CMOS APS X-ray detector as a function of energy in terms of X-ray sensitivity (or signal transfer property (STP)), presampling modulation transfer function (pMTF), normalized noise power spectrum (NNPS), and the resulting detective quantum efficiency (DQE). A previously validated Monte Carlo technique [33]-[35] was also used to compare the maximum X-ray detectability of the system to the experimentally measured DQE at low spatial frequencies. It is worth mentioning that during the last decade several researchers used synchrotron monochromatic radiation to investigate the performance of CMOS-based X-ray detectors for small-angle X-ray scattering, wide-angle X-ray scattering (e.g. protein crystallography) and medical imaging [36]-[38]. The choice of these detectors was based mainly on the large area, suitable pixel pitch, wide dynamic range, and fast readout speed of the CMOS sensors. The choice of the current detector (namely Dexela 2923 CMOS X-ray detector) for the

characterization in monochromatic synchrotron radiation was driven by the detector size (29 cm x 23 cm) which is suitable for mammography and breast tomosynthesis, the simplicity of the manufacturing technology, and high X-ray performance in terms of pMTF and DQE [39]. Finally, besides casting light on the sensor/scintillator behavior at different X-ray energies (notably around the iodine K-absorption edge), we also show how these data could be used to estimate the detector behavior for any X-ray spectrum within the considered energy range. Hence, image simulation based on the monochromatic performance parameters can be used to predict how the mammographic image quality changes as a function of the used radiographic beam quality and exposure.

### **II. MATERIALS AND METHODS**

# A. The CMOS APS sensor

The X-ray detector is based on a CMOS APS sensor developed by Dexela Limited (A PerkinElmer company). Each pixel contains an option for switching the full well capacity between two separate modes, namely high full well (HFW) with dynamic range of 73 decibels (dB) and low full well (LFW) with 69 dB [39], which is operated globally across the whole active area. The LFW mode has lower read noise (around 165 electrons (e) root mean square (r.m.s.)) at the expense of reduced full well capacity (around 0.5 x  $10^6 \text{ e}^{-1}$ ) compared to the HFW mode (around 360 e<sup>-</sup> r.m.s. and 1.6 x 10<sup>6</sup> e, respectively) [39]. Preliminary results demonstrated that the dark current at around 30 °C is  $6 \pm 1$  and  $3 \pm 1$ pA/cm<sup>2</sup> in HFW and LFW modes, respectively [40]. The typical active area of a single sensor module at full resolution (pixel pitch equal to 75 µm with fill factor 84 %) is 1944 x 1536 pixels, i.e. 14.5 x 11.5 cm (namely Dexela 1512 CMOS X-ray detector). The vertical dimension consists of 6 stitched periphery blocks. Each block is connected to a dedicated 14bit analog-to-digital converter (ADC) used to convert e to digital numbers (DN). In the current study a 2 x 2 array of sensors was implemented using the tiling technology with an overall area of 29 cm x 23 cm (namely Dexela 2923 CMOS X-ray detector). The average conversion gain K (e/DN) of the four sensors forming the X-ray detector is  $119.6 \pm 2.9$  and  $38.8 \pm 0.6 \text{ e}^{-}/\text{DN}$  in HFW and LFW modes, respectively [39]. The CMOS APS sensor is front-side illuminated and was optically coupled to a scintillator using a 3 mm thick fiber optic plate (FOP) to eliminate direct interaction of X-rays in the sensor material. It was calculated that this FOP absorbed more than 99.999 % of the input X-rays in the investigated energy range.

### B. The scintillator coupled to the CMOS APS

In this study a 200  $\mu$ m thick structured CsI:Tl scintillator was coupled to the CMOS APS sensor. The term "structured" refers to the high-density fibres of this scintillator, i.e. it is columnar structure (5-10  $\mu$ m diameter) resulting from growth on a specially designed substrate [41]. This setup results in high (85 %) packing density (active phosphor volume/total screen volume) values [42]. Hence, the respective coating thickness is 76.7 mg/cm<sup>2</sup>. The columnar structure also reduces the lateral spread of the visible photons, resulting in superior spatial resolution compared to bulk or granular scintillators. Therefore, it preserves good spatial resolution at the increased layer thickness required to have sufficient X-ray detection efficiency [43]. This scintillator features high light yield (around 55000 optical photons/MeV) and green light spectrum (with strong peak emission in the green region of the spectrum at 560 nm) [44].

# C. Calculation of the maximum X-ray detectability

An important parameter of the scintillator is the ability to convert the input X-ray signal into useful visible light (or optical) quanta. This is described analytically by the quantum detection efficiency (QDE) and energy absorption efficiency (EAE) parameters. The QDE (also termed intrinsic efficiency) corresponds to the ratio of the absorbed over the incident number of X-ray photons. This parameter depends on the attenuation coefficient and the thickness of the scintillator. For the monochromatic X-ray beam used in the current study, the QDE is given by the following formula [6], [45]:

$$QDE = 1 - e^{-\mu_{tot}(E)w_0}$$
(1)

where  $\mu_{tot}(E)$  and  $w_0$  are the scintillator's linear attenuation coefficient [46] and thickness, respectively. However, scintillators are energy integrating detectors, therefore the EAE parameter is considered more appropriate as it describes the fraction of incident energy absorbed locally at the points of X-ray interaction within the scintillator [45]. This parameter depends on the amount of energy absorbed in the scintillator per absorbed X-ray photon, the X-ray photons attenuated in the scintillator and the amount of incident energy. The monochromatic EAE is given by the following equation, a simplification of the integral EAE equation given in [45]:

$$EAE = \left(\frac{\mu_{tot,en}(E)}{\mu_{tot}(E)}\right) (1 - e^{-\mu_{tot}(E)w_0})$$
(2)

where  $\mu_{tot,en}(E)$  is the energy absorption coefficient of the scintillator [46]. This parameter includes all mechanisms of energy deposition locally at the point of X-ray interaction within the scintillator. The parameter  $\mu_{tot,en}(E)$  describes the probability per unit length that the energy deposited per incident X-ray photon is locally absorbed in the scintillator, while  $\mu_{tot}(E)$  represents the probability per unit length that the incident photon interacts with the material. It should be noted that when calculations of QDE or EAE are made, the packing density value needs to be considered [6].

As mentioned above, the EAE is expected to provide a suitable representation of the signal detection efficiency, i.e. the detective quantum efficiency at zero spatial frequency (DQE(0)) [45]. This is valid for energies lower than the K-edge of the material the scintillator is made of. However, for higher energies the EAE can underestimate the X-ray

detectability, because  $\mu_{tot,en}(E)$  assumes that the energy of any generated K-fluorescence photon escapes the scintillator, while in this energy range  $\mu_{tot}(E)$  represents the increased probability that both the incident and K-fluorescence X-ray photons will be attenuated. Therefore, their ratio drops at the K-absorption edges. On the other hand, the QDE overestimates the detectability of the input signal, because it assumes that all the K-fluorescence photons are re-absorbed within the scintillator. In truth, an amount of K-fluorescence energy is re-absorbed within the scintillator, which cannot be precisely described by the analytical QDE and EAE parameters.

A Monte Carlo technique was used in this study to give a more precise description of the signal detection efficiency by calculating the actual ratio of the reabsorbed K-fluorescence X-ray photons. Monte Carlo simulations were performed considering a relative standard deviation of less than 5%. Xray detection evaluation was carried out by using a custom Monte Carlo code [33] developed for the assessment of the overall performance of indirect phosphor-based medical imaging detectors. Monte Carlo modeling has been performed for traditional rare-earth materials [33], [34] (e.g., Gd<sub>2</sub>O<sub>2</sub>S:Tb) and for compact powder phosphors under development [34] (e.g., Lu<sub>2</sub>O<sub>3</sub>:Eu), taking into account the principal X-ray interactions, such as: a) photoelectric absorption (including the simulation of K-fluorescence radiation), b) Compton, and c) Rayleigh scattering. The validity of the code has been verified in terms of the sampling algorithm subroutines [33] and previous experimental data and analytical calculations [33] - [35]. Recently, a sophisticated investigation was reported in zero-frequency DQE overestimations of commercially available X-ray imaging converters (e.g., Gd<sub>2</sub>O<sub>2</sub>S:Tb, CsI:Tl, and a-Se) based on the study of energy impartation events [35]. This study illustrates that the Monte Carlo techniques have an advantage over other theoretical approaches for the prediction of QDE and DQE(0). It should be noted that, while in principle this would have been possible also by means of established Monte Carlo packages (e.g. Geant4, MCNP, PENELOPE, FLUKA etc.), this would have required code modifications, which would have been time consuming for the purposes of the present study. Briefly, the large area limit of the DQE (DQE(0)) for a scintillator can be derived as [47]–[49]:

$$DQE(0) = QDE \cdot I \tag{3}$$

where *I* is the Swank factor that describes the noise associated with the X-ray to light conversion process and the statistical distribution of the number of the secondary generated optical photons. For a monochromatic X-ray beam with energy  $E_i$ , the Swank factor is calculated as:

$$I(E_i) = \frac{M_1^2(E_i)}{M_0^2(E_i)M_2^2(E_i)}$$
(4)

where  $M_j(E_i)$  is the corresponding  $j^{th}$  moment of the light pulse height statistical distribution which can be measured using pulse height spectroscopy [49], [50]. Swank showed that for monochromatic X-rays and under certain reasonable conditions [47], I is equal to the product of  $I_{\text{AED}}$  and  $I_{\text{OPD}}.$  In particular, IAED describes the statistical factor of the absorbed X-ray energy distribution as a function of energy. It depends mainly on the K-fluorescence X-rays escape and reabsorption, and slightly on X-rays undergoing inelastic effects followed by photon escape. Hence, it is close to unity for energies lower than the K-absorption edge, and drops to a minimum just above the K-absorption edge due to the escape of characteristic K-fluorescence photons [35], [49], [50]. I<sub>OPD</sub> describes the variations in the optical pulse distribution, and depends on the light propagation (scattering and reabsorption) inside the scintillator [20]. It is independent of the X-ray energy and depends on the scintillator material and thickness. Reference [49] determined experimentally the I<sub>OPD</sub> for different thicknesses of CsI:Tl scintillator, by combining the measured I with the calculated  $I_{\text{AED}}.$  In the current study, the Monte Carlo calculated QDE and IAED where combined with the bibliographic I<sub>OPD</sub> to get the DQE(0) of the scintillator.

## D. Experimental Setup

The X-ray performance evaluation of the detector was carried out at the SYRMEP (SYnchrotron Radiation for MEdical Physics) beamline at the ELETTRA synchrotron radiation facility in Trieste, Italy. The X-ray beam originates from one of the bending magnets of the storage ring. A double-crystal Si(111) monochromator is used to select the required energy in the range 8.5-35 keV, with an energy resolution of about 10<sup>-3</sup> [51]–[53]. In the current study, eight monochromatic energies were used for the detector evaluation: 17, 20, 23, 26, 29, 33, 33.3 and 35 keV. An ionization chamber was positioned in the "experimental" hutch at around 23 m from the source, to monitor the exposure. In our study, the detector was mounted on a motorized translation stage at a distance of around 32 m from the source in the "patient" room (the SYRMEP beamline features two hutches that can be used for imaging - an "experimental" hutch upstream and a "patient" room immediately downstream; the name of the latter comes from the in vivo program currently underway in that room [54]). A tungsten (W) slit system determined the cross section of the beam impinging on the detector, and this was adjusted to 206 mm x 3 mm on the detector surface. A motorized stage enabled vertical continuous scanning of the detector in the plane perpendicular to the direction of the X-ray beam with a speed of 15 mm/s. The integration time of the detector was set to 15 s, leading to a total uniformly irradiated area of about 206 mm x 220 mm.

## E. X-ray Performance Evaluation of the Detector

The X-ray performance of the detector was evaluated in terms of STP, pMTF, NNPS, and DQE. The STP describes the X-ray sensitivity and relates the average output signal (in DN) with the input Air Kerma ( $K_a$ ; in  $\mu$ Gy) at detector surface. The average DN was calculated from a region of interest (ROI) of

2350 x 2350 pixels (176.3 mm x 176.3 mm) from each frame over 4 frames. The images were dark field subtracted and flat field corrected to apply gain and offset correction [55].

The pMTF describes the contrast reduction at the different spatial frequencies that compose the image, and is used to quantify the spatial resolution of an imaging system. For the determination of the pMTF, the edge technique [56] was used according to the IEC standard [57] based on the algorithm presented in [58]. Briefly, an opaque and polished edge test object (W foil, 1 mm thick, 99.95 % pure [59]) was placed at a shallow angle  $\alpha$  (1.5°-3°) with respect to the detector pixel rows and columns. The pixel values of seven consecutive lines centrally located across the edge were then used to generate seven oversampled edge profiles (or edge spread function (ESF) curves) along the sampling direction. This number of ESF curves sufficiently reduces the statistical noise and simultaneously covers both dark and white areas of the edge test image. The ESF curves were shifted laterally to overlap with each other and combined to calculate the average oversampled ESF curve. The latter was then differentiated to get the oversampled line spread function (LSF). The pMTF was obtained from the modulus of the Fourier transform (FT) of the oversampled LSF and normalized to one at zero spatial frequency:

$$pMTF(x) = \left| FT\{LSF(x)\} \right| = \left| FT\left\{ \frac{d}{dx} [ESF(x)] \right\} \right| \quad (5).$$

Finally, the vertical and horizontal pMTF values were calculated (from 0.5 line pairs per millimeter (lp/mm) to Nyquist Frequency ( $F_{Nyq}$ ) with an interval of 0.5 lp/mm) and combined to determine the average (over the edge's orientations) pMTF.

The NPS describes the spectral decomposition of the noise variance in an image as a function of spatial frequency and it expresses the noise transfer. Hence, flat field images (including background illumination only) were acquired to calculate the combined detector (also termed read), dark current- and background-induced (also termed quantum) noise. Offset and gain corrections were applied to the flat images to remove the dark offset and minimize gain variations between different pixels (also known as fixed pattern noise). A modified gain correction algorithm was used to compensate for the number of used reference flat frames [55]. The NPS was then calculated by applying a two dimensional (2D) algorithm to a corrected flat field image [57], [60]:

$$NPS(u,v) = \frac{\Delta x \cdot \Delta y}{M \cdot N_x \cdot N_y} \sum_{m=1}^{M} \left| FT\left\{ I(x_i, y_i) - S(x_i, y_i) \right\} \right|^2$$
(6)

where I(x,y) is the corrected flat field image, S(x,y) is a second order polynomial fit to remove low frequency (less than 1 lp/mm) background trends, u and v are the spatial frequencies corresponding to x and y orientations,  $\Delta_x$  and  $\Delta_y$ are the x and y pixel pitches,  $N_x$  and  $N_y$  express the ROI size in pixels (256 pixels in our case) and M is the number of ROIs used to calculate the average NPS. In order to use the NPS for the DQE calculation, seven lines on either side of the central axes of the 2D NPS (omitting the axes themselves) were used to compute the one dimensional (1D) horizontal and vertical NPS. The axes were omitted because they may be susceptible to any remnant column- or row-wise fixed pattern noise on the flat field images. The data were binned in spatial frequencies from 0.5 lp/mm to  $F_{Nyq}$  with an interval of 0.5 lp/mm [57]. The horizontal and vertical NPS(x) were divided by the square of the mean pixel value (DN<sup>2</sup>) of the corrected flat images (for given energy and K<sub>a</sub>) to obtain the NNPS [60]. The mean DN corresponds to the Fourier Transform of the flat field image at zero spatial frequency and this normalization is made in accordance to the normalization of the pMTF. Finally, the horizontal and vertical 1D NNPS values were combined (i.e. simply averaged) to calculate the average 1D NNPS.

The DQE expresses the fraction of input X-ray quanta effectively used for image signal-to-noise ratio (SNR) at each spatial frequency, and describes the ability of a particular system to use the available input quanta. In our case, it depends on the X-ray absorption, noise, and resolution of the front-end (scintillator), and the noise and resolution of the back-end (CMOS sensor) part of the X-ray detector. It is calculated using the following formula [57], [60]:

$$DQE(f) = \frac{SNR_{out}^2}{SNR_{in}^2} = \frac{pMTF^2(f)}{\frac{\Phi}{K_a} \cdot K_a \cdot NNPS(f)}$$
(7)

where  $\Phi/K_a$  is the photon fluence per exposure ratio (in Xrays per mm<sup>2</sup> per  $\mu$ Gy), assuming that the detector behaves as an ideal photon counter [61], [62], pMTF(f) is the average presampling modulation transfer function and NNPS(f) is the average normalized noise power spectrum. It should be noted that the current system consists of an energy integrating detector, so an energy-weighted calculation of the  $\Phi/K_a$  would be more realistic. However, Samei and Flynn [63] demonstrated that for 70 kV (W/Al anode/filtration combination) with additional 19 mm Al, the difference photon-counting between the energy-weighed and approximations is less than 3%. This difference is even smaller for lower energy spectra. In practice, the input signalto-noise ratio square  $(SNR_{in}^2)$  corresponds to the photons fluence  $(\Phi)$  due to the Poisson distribution of the input quanta. The output  $SNR^2$  ( $SNR_{out}^2$ ) is calculated from the ratio between  $pMTF^{2}(f)$  and NNPS(f). Usually the experimentally measured DOE(0) is excluded from the DOE analysis because low-frequency artifacts (such as background trends) can result in unusually high NNPS at zero spatial frequency, leading to underestimation of the DQE. Therefore, its inclusion might make it hard to distinguish between low frequency artifacts and stochastic noise. As aforementioned, detrending can be used to reduce the low frequency trends. However, this does not change the mean value (i.e. the central point on the 2D NNPS array), and it does not completely remove the excessively large values along the u and v axes [60].

It should be noted that we have previously characterized the same detector under clinical mammographic (W/Al at 28 kV) and general radiography (W/Al at 50 kV (RQA3) and 70 kV (RQA5)) conditions [39]. Briefly, the mammographic DQE at 0.5 lp/mm spatial frequency (DQE(0.5)) was found in the range 0.58-0.71 in HFW mode and 0.53-0.70 in LFW mode, respectively. This study presents the X-ray performance of the detector over a wide range of mammographic energies and can form the basis for predicting the pMTF, NNPS, DQE and image quality for different mammographic beam qualities. For brevity, we demonstrate the detector's performance in HFW operation mode only.

# III. RESULTS AND DISCUSSION

# A. Importance of the investigated parameters

The purpose of medical imaging is to provide sufficient information about specific aspects of human body structure or function. Hence, the quality of a radiograph needs to be adequate to provide the required information for a given task. The primary physical parameters that affect image quality are spatial resolution (the ability to represent distinct anatomic features inside the irradiated object), noise (systematic and random variations superimposed on the actual measured signal), and contrast (magnitude of the relative signal difference between the object of interest and the surrounding background) [64]. The pMTF is the combination of contrast and resolution, the NPS combines the noise and resolution, and the SNR expresses the ratio between signal and noise in large scale objects (i.e. at zero spatial frequency). The combination of SNR, pMTF and NPS determines the DQE which represents the ability to visualize object details of a certain size and contrast (contrast-detail resolution). The experimentally measured X-ray performance parameters in this study are STP (which expresses the X-ray sensitivity of the detector), pMTF, NNPS, and DQE. Finally, QDE, EAE and Monte Carlo DQE(0) were calculated to express the absorption of X-rays (at zero spatial frequency) from the scintillator.

#### *B.X-ray Sensitivity of the Detector*

Fig. 1a shows the STP curves of the detector operated in HFW mode for different energies. It should be noted that DN refers to analog to digital conversion and therefore is an arbitrary unit. The sensor conversion gain (K (e<sup>7</sup>/DN)) could be used to express the output signal in absolute units of electrons. However, in X-ray performance evaluation studies the X-ray sensitivity is commonly expressed by the output pixel value (in DN) as a function of the input  $K_a$  (in  $\mu$ Gy). The detector demonstrated linear signal transfer with coefficients of determination (R<sup>2</sup>) greater than 0.9997 in all cases. We observe an increase in the signal from the detector per unit  $K_a$ 

as the energy increases. According to [65] this is due to three reasons: First, the number of X-rays per unit K<sub>a</sub> per unit area  $(\Phi/K_a)$  increases as the X-ray energy increases up to around 60 keV [66]. Therefore more X-rays (primary signal carriers) are impinging on the scintillator for a given exposure. In our case, it was found that the  $\Phi/K_a$  increases from 4085 Xrays/mm<sup>2</sup>/µGy at 17 keV to 16291 X-rays/mm<sup>2</sup>/µGy at 33 keV (74.9 % increase). Secondly, more secondary quanta (i.e. optical photons) are generated for a higher energy absorbed X-ray photon assuming an almost fixed scintillator's light yield (i.e. optical photons per absorbed energy). In practice, there is a small scintillator light yield non-proportionality, i.e. the photon response of the scintillator changes as a function of energy. In our case, this happens mainly because the energy deposited by the secondary generated electrons changes abruptly in the energies around the K- and L-absorption edges of iodine. It was found that the photon non-proportionality response of the CsI:Tl scintillator changes from around 1.145 at 17 keV to around 1.115 at 33 keV (these values are normalized to unity at 662 keV) [67] - [69]. Combining the non-proportionality values with the light yield of the scintillator, it was calculated that around 1071 and 2024 optical photons are created per absorbed X-ray at photon energies of 17 keV and 33 keV respectively, resulting in 89 % increase. Finally, there is a depth effect, i.e. as the energy increases, the beam becomes more penetrating, so the interacting X-rays are absorbed at deeper points within the scintillator, closer to the digital sensor. Hence, the created optical photons are less likely to be reabsorbed in the scintillator, leading to increased collection efficiency from the digital sensor. For example, assuming that the scintillator consists of 10 layers, only 1.55 % of the X-ray photons are absorbed in the 10<sup>th</sup> layer at 17 keV. The corresponding value for 33 keV is 3.23 %, which corresponds to 108.1 % increase. It should be noted that the change in the detector signal per unit K<sub>a</sub> as the energy increases is the combination of the above three reasons and the absorption of X-rays from the scintillator. This is obvious in Fig. 1b which shows the gradients of the above STP curves as a function of energy. An almost linear increase up to 33 keV is observed. However, for energies higher than the K-absorption edge of iodine (33.2 keV), we observe much higher slopes due to the increased absorption of X-rays from the scintillator. In particular, the STP slope increases by 53.8 % (from 33 to 33.3 keV) while the respective DQE(0) value (which takes into account the absorption of X-rays (QDE) and the K-fluorescence X-rays escape and re-absorption (Swank Factor)) increases by 50.8 %, indicating that these two parameters are directly related at energies around the K-absorption edge of iodine.

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Fig. 1. (a) STP curves and (b) their slopes as a function of energy

# C. Spatial Resolution as a Function of Energy

Fig. 2 shows the average pMTF curves of the detector over the range of used energies. For energies up to 33.2 keV the pMTF decreases slightly with increasing energy. In particular, the average relative difference between the pMTFs of 17 and 33 keV is less than 5.5 %. The most likely explanation for this is the longer range of the photoelectron in the scintillator material. As the columnar structure of the CsI:Tl scintillator prevents the lateral spread of the light photons, the increased X-ray absorption depth as a function of energy does not increase the pMTF, as is the case in granular scintillators such as gadolinium oxysulfide (Gd<sub>2</sub>O<sub>2</sub>S:Tb). In the investigated energy range, the pMTF curves reach 50% at about 3 lp/mm. At energies above 33.2 keV, the pMTF values are smaller due to the lateral spread of the K-fluorescence X-ray photons. In this case, the pMTFs reach 50 % at around 2 lp/mm. A comparison between the pMTF curves at 33 and 33.3 keV shows decreasing resolution as a function of spatial frequency from 4 % for 0.5 lp/mm to 26 % for 6.5 lp/mm. The average relative difference between the pMTFs of 33 and 33.3 keV is 18.5 %. A similar behavior was observed in our previous study [70], which compared the pMTF curves of CsI:Tl for three X-ray beams: 32 kV using a molybdenum (Mo) anode X-ray tube and 32 keV and 34 keV using monochromatic synchrotron radiation. The pMTF at 35 keV is slightly higher than 33.2 keV (1.5 % average relative difference), probably due to a smaller effect of the K-fluorescence X-ray photons. Finally, it is worth mentioning that the FOP did not introduce a loss of spatial resolution due to the way it is constructed. In particular, a typical FOP consists of multiple single fibers of several µm diameter. Each single fiber consists of a core glass which transports light by reflecting the optical photons. A cladding glass surrounds the core glass and it is enhanced with an extra-mural absorber that absorbs light leakage from the core glass. Hence, the optical photons are prevented from



Fig. 2. Average pMTF curves as a function of energy

# D.Noise Assessment

reaching adjacent fibers.

For brevity's sake, only the NNPS curves at 33 keV and 33.3 keV for HFW mode are shown in Fig. 3. It can be observed that the NNPS values decrease as a function of  $K_a$  due to the larger increase in the signal compared to the increase in noise. This results in increasing DQE values as a function of exposure, up to a maximum detectability point where the detector exhibits quantum limited behavior (i.e. the X-ray quantum noise is the dominant source of noise). The comparison between the two energies shows that the spectral shape of the NNPS remains the same, i.e. does not seem to be affected by the K-fluorescence X-rays of iodine. However, for similar  $K_a$  levels, the NNPS curves for 33.3 keV are lower compared to 33 keV which corresponds to higher SNR and DQE values. This happens due to the increased X-ray detectability from the scintillator.



Fig. 3. Representative average NNPS at (a) 33 keV and (b) 33.3 keV

# E. X-ray Detectability as a Function of Energy

Fig. 4 shows the average DQE curves of the detector operated in HFW mode for the energies 17, 20, 23 and 26 keV. It was found that the uncertainties on the DQE values are less than 8 %. However, these have not been included in the figure to avoid cluttering it. It can be observed that the DQE values decrease as a function of energy mainly due to the decreased X-ray detectability from the scintillator. In particular, the DQE(0.5) values are in the range 0.79-0.85 at 17 keV, 0.75-0.79 at 20 keV, 0.64-0.69 at 23 keV, and 0.55-0.60 at 26 keV. Other reasons leading to decreased DQE values as a function of energy are a) the decrease in the pMTF, b) a change in the NPS and c) an increase in the  $\Phi/K_a$  [71]. Fig. 5 shows the average DQE curves of the detector

(HFW mode) for the energies 29, 33, 33.3 and 35 keV. In this case, the uncertainties on the DQE results are less than 10 %. For the first two energies the DQE values decrease as a function of energy due to the decreased detectability of X-rays from the scintillator. The DQE(0.5) values are in the range 0.46-0.50 at 29 keV and 0.35-0.36 at 33 keV. At higher energies, the DQE values are increased due to the K-absorption edge of iodine. More specifically, the DQE(0.5) values are in the range 0.54-0.57 at 33.3 keV and 0.53-0.55 at 35 keV. We can observe that the higher energy DQE curves have different spectral shape compared to the lower ones. This happens due to the spread of the K-fluorescence photons that decrease the spatial resolution of the detector (see Fig. 2).



Fig. 4. Average DQE at (a) 17 keV, (b) 20 keV, (c) 23 keV and (d) 26 keV (HFW mode)

Fig. 6 compares the maximum DQE values (i.e. at 0.5 lp/mm) in HFW operation mode to the analytically calculated QDE / EAE and the Monte Carlo calculated DQE(0) of the scintillator. The maximum DQE(0) has not been extracted from the experimental data because it is difficult to completely remove the excessive large area signal at zero spatial frequency (see section *II.E.*). Previous studies estimated the DQE(0) values by applying either first-order linear extrapolation [72] or second-order polynomial extrapolation [65] to the measured DQE curves. However, in the current work it was found that the extrapolation does not have the same effect on all curves, leading to unsatisfactory

extrapolations at 0 lp/mm. It was found that the % difference between DQE(0) and DQE(0.5) was in the range 1-6 %. Therefore, it was decided to use DQE(0.5) as the minimum spatial frequency DQE. It can be observed that the EAE describes well the maximum detectability of the system for energies below the K-absorption edge of the iodine. However, at higher energies, it severely underestimates the detectability (see section *II.C.*). On the other hand, the QDE overestimates the maximum detectability especially at energies higher than 33.2 keV. Conversely, the Monte Carlo (MC) calculated DQE(0) estimates accurately the maximum detectability of the system for all energies.



Fig. 5. Average DQE at (a) 29 keV, (b) 33 keV, (c) 33.3 keV and (d) 35 keV (HFW mode)



Fig. 6. Maximum DQE(0.5) compared to the analytical QDE / EAE and DQE(0) MC

Table I further quantifies the above by comparing the analytical QDE / EAE and DQE(0) MC to the experimentally measured DQE(0.5). It can be observed that the DQE(0.5) is 43 % lower compared to the QDE at 33.3 keV, while it is 39 % higher than the EAE at the same energy. On the other hand, the maximum difference between the measured DQE(0.5) and DQE(0) MC is less than 5 %, which is within the accepted precision on the DQE calculation (10 %) from the IEC standard [57]. These results demonstrate that at very small spatial frequencies, where the spatial resolution does not have any effect, the fraction of input X-ray quanta used to create the output image is limited only by the X-ray detectability of the front-end (scintillator) rather than the noise of the back-end (CMOS sensor) part of the X-ray detector.

 TABLE I

 COMPARISON BETWEEN THE MAXIMUM DQE(0.5) VALUES AND THE QDE / EAE AND DQE(0) MC

Energy (keV)	max DQE(0.5)	QDE	(%) QDE vs DQE(0.5)	EAE	(%) EAE vs DQE(0.5)	QDE MC	I <sub>AED</sub>	I <sub>OPD</sub>	DQE(0) MC	(%) DQE(0) MC vs DQE(0.5)
17	0.855	0.959	-12.172	0.899	-5.153	0.959	0.999	0.905	0.867	-1.449
20	0.794	0.872	-9.946	0.811	-2.168	0.872	0.999	0.905	0.789	0.572
23	0.692	0.757	-9.358	0.694	-0.176	0.756	0.999	0.905	0.684	1.208
26	0.604	0.639	-5.734	0.578	4.298	0.637	0.998	0.905	0.576	4.653
29	0.497	0.532	-6.992	0.476	4.196	0.532	0.996	0.905	0.479	3.691
33	0.362	0.416	-14.937	0.366	-1.102	0.416	0.994	0.905	0.374	-3.280
33.3	0.559	0.800	-43.063	0.344	38.553	0.803	0.777	0.905	0.564	-0.824
35	0.552	0.757	-37.189	0.341	38.239	0.757	0.788	0.905	0.54	2.181

Figure 7 shows how the DQE values at three spatial frequencies (0.5, 3.5 and 5.5 lp/mm) change as a function of energy (using the same  $K_a$  levels compared to Figure 6). As we discussed above, the DQE(0.5) is affected only by the X-ray absorption from the scintillator. However, the DQE at higher spatial frequencies is also affected by the ratio of pMTF to NNPS, i.e. the combination of contrast, spatial resolution and noise. The DQE decreases as a function of spatial frequency mainly due to the increasing effect of noise [73]. At high spatial frequencies (e.g. 5.5 lp/mm) the K-absorption edge effect on the DQE values is not significant.



Fig. 7. DQE as a function of energy for three spatial frequencies

It is worth mentioning that this type of analysis also offers the possibility to predict the X-ray performance of the detector for any mammographic beam quality within the investigated energy range. As an example, we used interpolation, extrapolation and the normalized spectral shape that corresponds to W/Al at 28 kV (as a weighting factor) to predict the horizontal DQE of the detector (in HFW mode) at 111  $\mu$ Gy (Fig. 8a). The maximum relative difference between the predicted and the measured (taken from [39]) horizontal DQE values was 6 % (Fig. 8b). This demonstrates that the data acquired at monochromatic energies could be combined to calculate the pMTF, NNPS, and DQE at different mammographic spectral shapes (i.e. different radiographic beam qualities). In turn, these parameters can be given as input to an image simulation program [40], [74] to predict the effect of the X-ray beam on image quality (e.g. in terms of contrast-to-noise ratio, contrast-detail analysis, detectability index, etc.). Table II compares the X-ray performance (in terms of spatial frequency corresponding to 50 % MTF and DQE peak) of the Dexela detector with that of three commercially available hydrogenated amorphous silicon (a-Si:H) based FPDs [75]. All three FPD detectors have pixel pitches equal to 100 µm and are optically coupled to CsI scintillators. Their X-ray performances were measured using either Mo/Mo at 28 kV or rhodium/rhodium (Rh/Rh) at 28 and 29 kV. Hence, the average energies of the used spectra were around 20 keV due to the combination of the K-fluorescence X-rays of Mo (K<sub> $\alpha$ </sub> at 17.4 keV and K<sub> $\beta$ </sub> at 19.6 keV) and Rh (K<sub> $\alpha$ </sub> at 20.2 keV and  $K_{\beta}$  at 22.7 keV) with the K-absorption edges of Mo (20.0 keV) and Rh (23.3 keV), respectively. Therefore, their performances can be compared with that of the Dexela detector at 20 keV. In the same table we also compare the monochromatic (23 keV) with the polychromatic (W/Al at 28 kV, average energy equal to 22.8 keV - taken from [39]) Xray performance of the Dexela detector. It can be observed that the spatial resolution of the Dexela detector at 20 keV (where it reaches 50 % pMTF at 2.8 lp/mm) is comparable to that of commercially available FPDs (which reach 50 % pMTF at 2.5-3.3 lp/mm). On the other hand, the Dexela detector demonstrates a higher DQE peak value (0.76) compared with the FPDs (0.41-0.59). Finally, the investigated detector at 23 keV demonstrates similar pMTF and DQE values compared with the polychromatic ones [39]. This is another demonstration that the DQE values of any mammographic spectrum can be predicted from the

monochromatic DQE data. It is worth mentioning that the DQE peak of the Dexela detector at 23 keV is higher compared to those of the FPDs, despite the reduced X-ray absorption from the scintillator.



Fig. 8. (a) Predicted compared to measured DQE values at 28 kV W/Al (HFW mode, 111 µGy) and (b) their relative difference (%)

TABLE II COMPARISON OF THE DEXELA DETECTOR WITH THREE COMMERCIALY AVAILABLE FPDs

Detector name	Radiation quality	pMTF(0.5) (lp/mm)	DQE peak	K <sub>a</sub> at detector (μGy)	
GE Senographe 2000D	28 kV Rh/Rh	3.2	0.41	91	
GE Senographe DS	28 kV Mo/Mo	3.3	0.40	86	
GE Essential	29 kV Rh/Rh	2.4	0.59	92	
Dexela 2923	20 keV	2.8	0.76	90	
Dexela 2923	28 kV W/Al	3.3	0.69	89	
Dexela 2923	23 keV	2.8	0.69	100	

## IV. CONCLUSIONS

The purpose of this study was to evaluate the performance of a CMOS APS X-ray detector in a range of monochromatic energies (17-35 keV), and give insight on phenomena that can not be observed directly with a polychromatic spectrum, i.e. how the pMTF, NNPS, and DQE values change as a function of energy, in particular in the vicinity of the iodine K-edge. For this reason, a synchrotron light source was used to provide eight distinct energies below and above the K-absorption edge of iodine. It was found that the maximum low frequency DQE values of the detector (operated in HFW mode) are similar to the calculated X-ray detectability of the scintillator, which indicates quantum limited behavior of the sensor. This means that the electronic noise of the CMOS sensor is marginal and the measurement floor is only due to the scintillator (frontend) rather than the CMOS sensor (back-end of the X-ray detector). However, at higher spatial frequencies, the DQE also depends on the relationship between the pMTF and NNPS, as illustrated in the current study. The high DQE performance, compared to commercially available a-Si:H FPDs, indicates the suitability of the detector in many low energy applications. The increased X-ray detectability of the system due to the K-absorption edge of iodine is promising for contrast enhanced mammographic applications such as dual energy and digital subtraction mammography (DSM). It should be noted that the pMTF values decrease at energies above 33.2 keV. However, the decreased resolution is not the most important parameter in dual energy or temporal subtraction mammography, which aim to depict vessels down to 3 mm diameter [76], [77]. Mammographic and breast tomosynthesis phantom images captured with the same detector and monochromatic synchrotron radiation will be the subject of a future publication. Finally, we demonstrated that the acquired data at monochromatic energies enable the calculation of pMTF, NNPS, and DQE at different spectral shapes within the investigated energy range. In turn, these can be used to predict the effect of the X-ray spectral shape on mammographic image quality by means of image simulation based on the experimentally measured pMTF, NNPS, and SNR.

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