

# Virtual monoenergetic images from dual-energy CT: systematic assessment of task-based image quality performance

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**Background:** To compare task-based image quality (TB-IQ) among virtual monoenergetic images (VMI) and linear-blended images (LBI) from dual-energy CT as a function of contrast task, radiation dose, size, and lesion diameter.

**Methods:** A TB-IQ phantom (Mercury Phantom 4.0, Sun Nuclear Corporation) was imaged on a thirdgeneration dual-source dual-energy CT with 100/Sn150 kVp at three volume CT dose levels (5, 10, 15 mGy). Three size sections (diameters 16, 26, 36 cm) with subsections for image noise and spatial resolution analysis were used. High-contrast tasks (e.g., calcium-containing stone and vascular lesion) were emulated using bone and iodine inserts. A low-contrast task (e.g., low-contrast lesion or hematoma) was emulated using a polystyrene insert. VMI at 40–190 keV and LBI were reconstructed. Noise power spectrum (NPS) determined the noise magnitude and texture. Spatial resolution was assessed using the task-transfer function (TTF) of the three inserts. The detectability index (d') served as TB-IQ metric.

**Results:** Noise magnitude increased with increasing phantom size, decreasing dose, and decreasing VMIenergy. Overall, noise magnitude was higher for VMI at 40–60 keV compared to LBI (range of noise increase, 3–124%). Blotchier noise texture was found for low and high VMIs (40–60 keV, 130–190 keV) compared to LBI. No difference in spatial resolution was observed for high contrast tasks. d' increased with increasing dose level or lesion diameter and decreasing size. For high-contrast tasks, d' was higher at 40–80 keV and lower at high VMIs. For the low-contrast task, d' was higher for VMI at 70–90 keV and lower at 40–60 keV.

**Conclusions:** Task-based image quality differed among VMI-energy and LBI dependent on the contrast task, dose level, phantom size, and lesion diameter. Image quality could be optimized by tailoring VMI-energy to the contrast task. Considering the clinical relevance of iodine, VMIs at 50–60 keV could be proposed as an alternative to LBI.

**Keywords:** Dual-energy; Phantoms, Imaging; image reconstruction; task-based image quality assessment; virtual monoenergetic images (VMI)

Submitted May 05, 2021. Accepted for publication Jul 27, 2021. doi: 10.21037/qims-21-477 View this article at: https://dx.doi.org/10.21037/qims-21-477

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## Introduction

In the last decade, beneficial applications of dual-energy CT (DECT) have been shown for different body regions (1-8). DECT offers the generation of so called virtual monoenergetic images (VMI) which can be used to increase CT attenuation of iodinated structures, to improve CT attenuation stability or to reduce metal artifacts (9-11). They can be reconstructed at different energies in kiloelectron Volt (keV) ranging from 40 to 200 keV (12). VMI at low-keVs improve the CT attenuation and therefore the contrast-to-noise ratio (CNR). They are therefore often used in vascular and contrast-enhanced parenchymal CT imaging (5). VMI at high-keVs on the other hand, show a reduction of beam-hardening artefacts and are used to reduce metal artefacts (13).

The use of VMI images from DECT has demonstrated improved lesion conspicuity and potential for contrast medium reduction (14) at equal or even lower radiation doses compared to traditional single-energy CT (SECT) (15). This will potentially lead to increased acceptance and implementation of DECT protocols in routine clinical practice in the future. Following these lines, certain institutions now routinely reconstruct VMI at certain keVs that are optimized for the investigated body region and clinical task in addition to linear-blended images (LBI) that aim to simulate the image perception of traditional SECT images at 120 kVp. In a white paper of the Society of Computed Tomography and Magnetic Resonance, the use of VMI was suggested in abdominal imaging, e.g., to improve conspicuity of liver or pancreatic neoplasms in late arterial phase (16). Another multi-institutional consensus statement has reported preferred VMI-energies for abdominal exams, i.e., 50 keV to improve contrast and 70 keV to decrease noise (17). The increased application of VMI may establish them as the primary diagnostic image series used in CT imaging. However, the impact of VMI on objective image quality and diagnostic accuracy has to be systematically characterized to facilitate their routine use in clinical practice.

Recently, a report of the American Association of Physicists in Medicine (AAPM) Task Group (TG-233) has suggested standardized methods to objectively assess task-based image quality parameters (18). These methods include the noise power spectrum (NPS), the task transfer function (TTF), and the detectability index (d'). These taskbased metrics offer the possibility to compare different CT images based on their performance related to a diagnostic task and not solely based on the subjective perception of image quality by the reader (19). Especially d' has shown promising results as a quality metric validated in clinical studies (20-22).

Because VMI at certain keVs have been described as being subjectively blotchy or patchy (23), potential differences in noise texture may influence detectability and hamper their widespread implementation into routine clinical practice. Recently, task-based image quality parameters have been investigated for VMI at 40–140 keV among four different DECT approaches (24) as well as for different reconstruction algorithms on a dual-source dual-energy CT (25). In both studies, the authors found differences in image noise texture, spatial resolution as well as d' depending on the imaging setup and VMI-energy. However, both studies were limited to a single phantom size, an iodinated contrast task, a single lesion size and did not include LBI nor the full range of available VMI-energies.

Therefore, the purpose of our experimental study was to systematically investigate task-based image quality parameters of VMI compared to traditional LBI as a function of detection task, VMI-energy, patient size, lesion size, and radiation dose for dual-source dual-energy CT.

We present the following article in accordance with the MDAR reporting checklist (available at https://dx.doi. org/10.21037/qims-21-477).

## Methods

This study conformed to the provisions of the Declaration of Helsinki (as revised in 2013). Ethical approval was not necessary because of the design as phantom study.

#### Phantom and scan setup

A commercially available task-based image quality phantom was used (Mercury Phantom 4.0, Sun Nuclear Corporation, Middleton, WI, USA). The phantom consists of polyethylene (nominal contrast of -95 HU at 120 kVp), has a length of 52 cm and five different size sections with diameters of 16, 21, 26, 31, and 36 cm, respectively (*Figure 1*). Of these size sections, the 16, 26, and 36 cm sections were analyzed to emulate a pediatric, an intermediate-sized adult, and a large-sized adult patients. Each size section has a subsection with uniform material to measure noise magnitude and noise texture using the NPS. Furthermore, each section has a subsection with five cylindrical inserts (each diameter of 2.54 cm) of different materials and



**Figure 1** Phantom design. Schematic shows phantom with five cylindric size sections (left). Each section consists of subsections for noise and spatial resolution analysis. The spatial resolution subsection (right) had five cylindrical inserts of different materials of which bone, iodine, and polystyrene were investigated in this study. Image modified with permission from (26).

contrast properties to assess the spatial resolution as TTF. Of these inserts, the bone, polystyrene, and iodine inserts (iodine concentration of 10 mg/mL) with a nominal contrast to the background of +1,000, +50, and +335 HU, respectively, were used.

The phantom was imaged on a third-generation dual-source CT scanner (SOMATOM Force, Siemens Healthineers, Forchheim, Germany) in dual-energy mode using the vendor-specific protocol for DECT of the abdomen with the following parameters: collimation of  $64\times0.6$  mm, gantry rotation time of 0.5 s, pitch of 0.6, tube voltage of 100 kVp for tube A and 150 kVp for tube B with additional tin filtration (Sn150 kVp). CT scans were performed at three different dose levels with a target volume CT dose index (CTDI<sub>vol</sub>) of 5, 10, and 15 mGy by adjusting the tube current time product (mAs). Scans were repeated three times for each dose level.

Datasets of the low- and high-energy spectra and LBI with a blending ratio of 0.6 were reconstructed at a slice thickness of 1.5 mm with an increment of 1 mm using a quantitative reconstruction kernel (Qr40) and an advanced modeled iterative reconstruction algorithm at a strength level of three (ADMIRE, Siemens Healthineers). These reconstruction parameters are recommended to perform dual-energy post-processing with the vendor-specific software. Here, a Qr-Kernel is optimized for quantitative analysis of dual-energy information. The field of view of the

reconstruction was 420 mm.

The low- and high-energy datasets were used to create VMI using the vendor-specific workstation and a secondgeneration VMI reconstruction algorithm (Syngo.via VB10, Dual-Energy Workflow, Monoenergetic Plus application, Siemens Healthineers). This algorithm reconstructs VMI from the image space domain using a frequency-split approach. For further details please refer to (27). VMI were reconstructed at 15 different energies ranging from 40 to 190 keV at increments of 10 keV. *Figure 2* shows example CT images of the insert sections for different phantom diameters, doses, and VMI-energies.

## Image quality assessment

The linear-blended and VMI datasets were batch-processed using the open-source software suggested by AAPM TG-233 for TB-IQ (imQuest, Duke University, Durham, NC, USA) (18). The software contains an automated procedure specifically developed for the phantom used in this study: for each of the phantom's size sections, the procedure locates the five inserts and returns a discrete estimation of the NPS of the noise module (one per section), the TTF (one per section and insert), and the detectability index d' (one per section and insert) in the resolution module.

Task-based image quality assessment of the image types was divided in three elements. First, image noise magnitude



**Figure 2** CT images of the insert sections for different values of dose, VMI-energy and section size. (A) LBI at three different section sizes at 10 mGy; (B) LBI at three different dose levels for 26 cm; (C) VMI at different energy levels for 26 cm at 10 mGy. The position of the inserts matches that of *Figure 1*. The reconstruction field of view was 420 mm. VMI, virtual monoenergetic imaging; LBI, linear-blended images.

and noise texture were characterized by assessing the NPS and the normalized NPS (nNPS) (28). The software automatically classified the slices to use for NPS calculation by verifying the validity of a set of conditions (absence of task inserts, absence of landmark insert, anomalous HU values); typical numbers lie in the range 25–35. On each slice the software defined 8 square ROIs of size 30 mm  $\times$  30 mm, equally spaced in 45° radial increments. The bidimensional NPS was then calculated for each ROI and averaged over the ROIs and the slices, as per Eq. [1]:

$$NPS_{2D}\left(f_{x},f_{y}\right)$$

$$=\frac{p_{x}p_{y}}{R_{x}R_{y}}\frac{1}{N_{sl}}\frac{1}{N_{ROI}}\sum_{s=1}^{N_{sl}}\sum_{r=1}^{N_{ROI}}\left|FT_{2D}\left[ROI_{s,r}\left(x,y\right)-\overline{ROI_{s,r}}\right]\right|^{2}$$
[1]

where  $p_x$  and  $p_y$  are the pixel size in the x- and y-directions,  $R_x$  and  $R_y$  are the ROI size in pixels along the x and y axis, respectively,  $N_{sl}$  and  $N_{ROI}$  are the numbers of slices and ROIs, FT is the Fourier transform and  $\overline{ROI}_{s,r}$  is the mean pixel value of each ROI measured using a second-order polynomial fitting.

The software provided 1D radially averaged NPS curves, noise magnitude (pixel SD), and NPS average and peak spatial frequency ( $f_{av}$  and  $f_{peak}$ ).  $f_{peak}$  was used to compare noise texture. For nNPS, the NPS was normalized by a function of the ROI mean (29), namely the variance of the pixels in the ROI (30).

Second, resolution was measured for each insert using the spatial frequency at which the TTF reached 50% of its maximum (TTF<sub>50</sub>) (31,32). The software automatically classified the slices to use for TTF calculation by checking

d' parameter	Value
Observer model	NPW
Task contrast	Contrast of simulated lesion
Task diameter	Diameter of simulated lesion
Weight coefficient (n)	1
Noise geometry	2D
Pixel number	300×300
Pixel size	0.05 mm
Field of view	15 mm

NPW, non-prewhitening matching filter.

for the presence of the task inserts which have a distinctive diameter; typical numbers lie in the range 25–35. On each ROI, the HU values of the pixels were plotted as a function of their distance to the insert center to calculate the edge spread function (ESF). Deriving the ESF returned the line spread function (LSF) and the TTF was calculated by taking the normalized Fourier transform of the LSF. The TTF calculations were performed on each slice separately and then averaged. If the CNR of any slice was too low for the TTF to be significant (28), the analysis was performed on a single ESF ensemble using all the slices at once.

Third, the detectability index d' served as a metric for overall image quality because it aims to measure how well a certain material can be detected in the presence of noise (31,33). In this phantom setup, d' represents the task of detecting a uniform circular contrast object of a certain size on a uniform background. The d' values are calculated using a non-prewhitening matching filter (NPW) as model for the observer (18) according to the Eq. [2]:

$$d_{NPW}^{\prime 2} = \frac{\left[ \iint \left| W_{task} \left( u, v \right) \right|^{2} \cdot TTF^{2} \left( dudv \right) \right]^{2}}{\iint \left| W_{task} \left( u, v \right) \right|^{2} \cdot TTF^{2} \left( dudv \right) \cdot NPS \left( u, v \right) dudv}$$
[2]

Here,  $W_{task}$  describes a 2D circular shape representing a lesion. *Table 1* reports the parameters used by the software to model the lesion.

We decided to analyze the bone, iodine, and polystyrene inserts, as they mimic contrast differences encountered in abdominal studies in patients. Here, the bone insert served as an unenhanced high-contrast task (e.g., calciumcontaining stone), the iodine insert as a contrast-enhanced high-contrast task (e.g., enhanced vascular or strongly enhancing parenchymal structure as for example a hepatocellular carcinoma), and the polystyrene insert as an unenhanced low-contrast task (e.g., non-vascular lesion or hematoma). In addition, the detectability index d' was estimated for different simulated diameters of the three inserts varying from 3 to 10 mm. For each VMI-energy we therefore calculated 24 values (3 dose levels times 8 diameter sizes).

## **Results**

## Noise properties

Results of the NPS and nNPS as a function of image type and radiation dose are summarized in *Figure 3A-3C*, *Tables 2-4*, Tables S1-S4 and for the full frequency range in Figures S1,S2 of the Supplemental file.

Noise magnitude increased with decreasing radiation dose (e.g., for the intermediate size at 40 keV from 17.1 HU at 15 mGy to 27.6 HU at 5 mGy) and with decreasing VMIenergy (from 12.6 HU at 190 keV and 5 mGy to 27.6 HU at 40 keV and 5 mGy) for all three sizes. Noise magnitude was higher for VMI at 40, 50, and 60 keV compared to the LBI for all three radiation doses (*Figure 3A*).

Differences in noise texture (nNPS) were found for both very low and very high VMI-energies (40–60 keV, 130–190 keV) with a stronger noise contribution in the low spatial frequency region between 0.0 and 0.1 mm<sup>-1</sup> (*Figure 3B*). VMI at 60-80 keV demonstrated similar noise texture compared to LBI. Furthermore, a slight frequency shift to lower frequencies was found with increasing size (*Figure 3B,3C*).

#### **Resolution properties**

Results of spatial resolution (TTF) as a function of insert, image type, and radiation dose are summarized in *Figure 4A-4C* and *Table 5*.

Overall, the shape of the TTFs was unaffected by all three parameters for the bone and iodine inserts, indicating similar in-plane spatial resolution for high-contrast tasks (*Figure 4A*). The only exception was VMI at 190 keV for the iodine insert which showed decreased spatial resolution. For the polystyrene insert representing the low-contrast task, higher TTF50-frequencies were observed at low VMIenergies of 40–60 keV, indicating higher in-plane spatial resolution. This effect was on average pronounced at the



displayed because they demonstrated similar shape compared to adjacent energies. (C) Differences of normalized noise power spectrum for low frequencies. Normalized noise Figure 3 Noise properties. Graphs showing the noise power spectrum (A), normalized noise power spectrum (B), and normalized power spectrum for low frequencies only (C) as a function of the image type, radiation dose level, and phantom size. (A) Noise power spectrum. Overall noise magnitude increased with increasing phantom size and decreasing radiation dose. Furthermore, noise magnitude was higher for 40-60 keV compared to the LBI. Please note the differences in the y-axis scale for the noise power spectrum. VMI-energies of 90, 110-120, and 140-180 keV are not displayed because they demonstrated similar shape compared to adjacent energies. (B) Normalized noise power spectrum. A low frequency peak was observed for low (40–60 keV) and high keVs (130–190 keV). Of note, VMI-energies of 90, 110–120, and 140–180 keV are not power spectrum as a function of the image type, radiation dose level, and phantom size, for frequencies in the range 0–0.15 mm<sup>-1</sup>. Note the differences in noise textures for very low and very high VMI-energies as compared to LBI. LBI, linear-blended images; VMI, virtual monoenergetic imaging.

Image type	F	Radiation dose, noise magnitude (HL	J)
inage type	5 mGy	10 mGy	15 mGy
Linear-blended images	14.3±0.03	10.4±0.03	8.4±0.02
VMI 40 keV	27.6±0.08 (+93.7%)	20±0.05 (+92.7%)	17.1±0.02 (+102%)
VMI 50 keV	20.3±0.01 (+42.3%)	14.8±0.03 (+41.9%)	12.4±0.03 (+46.1%)
VMI 60 keV	15.8±0.01 (+10.8%)	11.5±0.02 (+11.5%)	9.5±0.02 (+12.5%)
VMI 70 keV	13.2±0.04 (-7.6%)	9.6±0.02 (-7.4%)	7.8±0.04 (-7.7%)
VMI 80 keV	12.2±0.07 (-14.6%)	8.8±0.02 (-14.4%)	7.2±0.03 (-15.3%)
VMI 90 keV	12.3±0.08 (-14.0%)	9.0±0.03 (-13.2%)	7.3±0.02 (-13.6%)
VMI 130 keV	12.5±0.06 (-12.6%)	9.2±0.02 (-12.0%)	7.5±0.03 (-11.5%)
VMI 190 keV	12.6±0.05 (-11.6%)	9.2±0.02 (-11.6%)	7.5±0.02 (-10.8%)

Table 2 Noise magnitude as a function of image type and radiation dose

Absolute and relative noise magnitude values of each VMI-energy compared to the linear-blended images for each of the three radiation doses at the intermediate phantom size (26 cm). Linear-blended images (LBI) served as reference standard. Values are given as mean ± standard deviation. Percentage change in noise magnitude of each VMI-energy compared to LBI is given in brackets. VMI, virtual monoenergetic imaging

#### Table 3 Peak noise frequency as a function of image type and radiation dose

	Radiation dose, peak noise frequency (mm <sup>-1</sup> )				
	5 mGy	10 mGy	15 mGy		
Linear-blended images	0.178±0.007 (0%)	0.189±0.001 (0%)	0.157±0.005 (0%)		
VMI 40 keV	0.079±0.001 (-56%)	0.079±0.002 (-58%)	0.079±0.013 (-50%)		
VMI 50 keV	0.163±0.007 (-9%)	0.184±0.020 (-3%)	0.189±0.020 (+20%)		
VMI 60 keV	0.163±0.007 (-9%)	0.189±0.013 (0%)	0.189±0.007 (+20%)		
VMI 70 keV	0.168±0.007 (-6%)	0.189±0.013 (0%)	0.189±0.013 (+20%)		
VMI 80 keV	0.168±0.015 (-6%)	0.184±0.007 (-3%)	0.189±0.013 (+20%)		
VMI 90 keV	0.168±0.015 (-6%)	0.184±0.007 (-3%)	0.142±0.007 (-10%)		
VMI 130 keV	0.094±0.007 (-47%)	0.100±0.007 (-47%)	0.094±0.007 (-40%)		
VMI 190 keV	0.079±0.013 (-56%)	0.084±0.007 (-56%)	0.079±0.007 (-50%)		

Absolute and relative peak noise frequency ( $f_{peak}$ ) values of each VMI-energy compared to the linear-blended images for each of the three radiation doses at the intermediate phantom size (26 cm). Linear-blended images (LBI) served as reference standard. Values are given as mean  $\pm$  standard deviation. Percentage change in noise magnitude of each VMI-energy compared to LBI is given in brackets. VMI, virtual monoenergetic imaging.

lowest radiation dose (*Figure 4B*,4*C*). This increased spatial resolution is also highlighted in the corresponding edge spread functions (ESF) as an increase in the slope of the ESF curves at low VMI-energies for the polystyrene insert (Figure S3 in the Supplemental file).

## Detectability properties

Results of the detectability index for each insert as a function of image type, radiation dose, phantom size, and lesion diameter are visualized in *Figure 5A-5C*.

	Radiation dose, average noise frequency (mm <sup>-1</sup> )				
	5 mGy	10 mGy	15 mGy		
Linear-blended images	0.265±0.001 (0%)	0.273±0.002 (0%)	0.273±0.001 (0%)		
VMI 40 keV	0.245±0.002 (-8%)	0.254±0.001 (-7%)	0.256±0.003 (-6%)		
VMI 50 keV	0.256±0.002 (-4%)	0.264±0.001 (-3%)	0.265±0.002 (-3%)		
VMI 60 keV	0.264±0.002 (-1%)	0.271±0.002 (-1%)	0.272±0.007 (-0%)		
VMI 70 keV	0.267±0.001 (+0%)	0.273±0.007 (-0%)	0.275±0.013 (+1%)		
VMI 80 keV	0.264±0.001 (-0%)	0.271±0.003 (-1%)	0.272±0.007 (-1%)		
VMI 90 keV	0.261±0.001 (-2%)	0.268±0.009 (-2%)	0.267±0.007 (-2%)		
VMI 130 keV	0.251±0.001 (-6%)	0.259±0.013 (-5%)	0.255±0.001 (-7%)		
VMI 190 keV	0.246±0.007 (-8%)	0.255±0.007 (-7%)	0.249±0.007 (-9%)		

 Table 4 Average noise frequency as a function of image type and radiation dose

Absolute and relative average noise frequency ( $f_{av}$ ) values of each VMI-energy compared to the linear-blended images for each of the three radiation doses at the intermediate phantom size (26 cm). Linear-blended images (LBI) served as reference standard. Values are given as mean  $\pm$  standard deviation. Percentage change in noise magnitude of each VMI-energy compared to LBI is given in brackets. VMI, virtual monoenergetic imaging.

For all image types and inserts, the detectability index increased with increasing radiation dose, decreasing phantom size, and increasing lesion diameter. The increase in d' with increasing radiation dose was non-linear showing a stronger increase between 5 and 10 mGy than between 10 and 15 mGy.

For the bone and iodine insert (high-contrast tasks), d' was higher for VMI at 40–80 keV compared to LBI at all three radiation doses. For both inserts, d' dropped substantially at higher VMI-energies (*Figure 6*). D' was highest for 60 keV for the high-contrast bone task and for 50 keV for the high-contrast iodine task.

For the polystyrene insert (low-contrast task), a higher d' was found for VMI at 70–90 keV while d' was lower for VMI at 40–60 keV (*Figure 6*).

## Discussion

In this study we systematically characterized task-based image quality metrics of VMI compared to traditional LBI from dual-energy CT. As VMI have become increasingly accepted as an alternative to conventional SECT images, particularly in abdominal CT, objective task-based characterization of their image quality has become important to benchmark and ensure diagnostic accuracy throughout the process of clinical implementation. Our results suggest that the detectability improved with increasing radiation dose, decreasing phantom size, and increasing lesion diameter, and differed depending on the VMI-energy and contrast task. Averaged across all settings, the detectability index d' was highest for VMI at 60 keV for the high-contrast bone task, for VMI at 50 keV for the high-contrast iodine task, and for VMI at 70–80 keV for the unenhanced low-contrast task (polystyrene). Taking into account the prevalence and clinical role of contrast-enhanced imaging, e.g., in parenchymal lesion detection and vascular imaging, we consider the iodine contrast task as the task with the highest clinical impact out of the three investigated tasks. Therefore, our findings suggest VMI at 50–60 keV as an overall comparable to superior alternative to LBI.

#### Noise magnitude and texture

Assessment of the NPS revealed, as expected, decreasing noise magnitude with increasing radiation dose level and decreasing phantom size. Moreover, noise magnitude increased substantially for low-keV VMI-energies. Noise texture was comparable for the majority of VMI-energies with the exception of very low- and very-high keVs. These showed frequency shifts to lower frequencies compared to LBI indicating blotchier noise texture. This finding is in line with the results by Greffier *et al.* who found a peak in the average spatial frequency at 70 keV with a shift towards lower frequencies from 70–40 and 70–100 keV on the same dual-source DECT system (25). We found comparable noise



**Figure 4** Resolution properties. TTF as a function of the image type, radiation dose level, and phantom size for all tasks (A), for the polystyrene task (B), and for 40 keV (C). (A) TTF as a function of the image type, radiation dose level, and phantom size. Standard errors are reported as colored areas. TTF was stable across all three parameters for the bone and iodine insert (top and middle row). For the polystyrene insert (bottom row), higher TTF50-frequencies were observed at low VMI-energies of 40–60 keV. This effect was stronger at lower radiation dose for all three phantom sizes. Of note, VMI-energies of 70, 110–120, and 140–180 keV are not displayed because they demonstrated similar shape compared to adjacent keVs. (B) TTF of polystyrene (low-contrast task) as a function of the image type, radiation dose level, and phantom size, for LBI and low VMI-energies. Higher TTF50-frequencies were observed at low VMI-energies of 40–60 keV. This effect increased with decreasing radiation dose. (C) TTF as a function of the contrast task, radiation dose level, and phantom size, for 40 keV. Standard errors are reported as colored areas. At this energy the low contrast task (polystyrene) consistently resulted in higher TTF50-frequencies indicating increase in-plane spatial resolution. TTF, task transfer function; VMI, virtual monoenergetic imaging.

				F	Radiation dose	Э			
Image type		5 mGy			10 mGy			15 mGy	
	Bone	lodine	Poly	Bone	lodine	Poly	Bone	lodine	Poly
Linear-blended	0.37±0.003	0.35±0.01	0.34±0.04	0.39±0.001	0.37±0.004	0.34±0.013	0.39±0.04	0.38±0.013	0.32±0.04
VMI 40 keV	+1.8%	-4.5%	+27.7%	+1.4%	-6.1%	+40.0%	+1.5%	-5.9%	+6.3%
VMI 50 keV	+1.7%	-2.8%	+14.6%	+1.3%	-4.1%	+19.1%	+1.5%	-4.1%	+3.6%
VMI 60 keV	+1.6%	-0.5%	+7.3%	+1.3%	-1.5%	+8.2%	+1.4%	-1.5%	+0.8%
VMI 70 keV	+1.4%	+2.1%	+1.2%	+1.2%	+1.8%	+2.5%	+1.3%	+1.4%	-0.6%
VMI 80 keV	+0.2%	+0.4%	-5.4%	+0.2%	+0.7%	-3.8%	+0.2%	+0.6%	-3.3%
VMI 90 keV	-1.0%	-1.6%	-9.4%	-0.8%	-0.8%	-6.2%	-0.8%	-0.4%	-0.6%
VMI 130 keV	-3.7%	-10.6%	-15.6%	-3.2%	-5.7%	-11.0%	-3.3%	-4.8%	-6.9%
VMI 190 keV	-5.4%	-28.0%	-16.8%	-4.7%	-10.2%	-12.3%	-4.9%	-9.6%	-5.7%

Table 5 Resolution properties as a function of image type and radiation dose

Task transfer function-frequency shift ( $TTF_{50}$ ) for each VMI-energy relative to the linear-blended images as a function of insert type and radiation dose at the intermediate phantom size (26 cm). Data is reported to illustrate general trends. For non-iodinated tasks, a monotonic behavior of VMI energies was found with decreasing resolution as the VMI-energy increases. For the iodinated task worse resolution compared to LBI was found at low and high energies and slightly improved resolution at 70–80 keV. Data indicates  $TTF_{50}$  in cycles per mm with standard deviation for linear-blended images as the reference standard. Data for VMI-energies is giving in percentage change compared to the reference. A positive change indicates a higher spatial frequency and therefore a higher in-plane spatial resolution. VMI, virtual monoenergetic imaging.





**Figure 5** Detectability index. Detectability index (d') as a function of image type, radiation dose, phantom size, and lesion diameter for bone (A), iodine (B), and polystyrene (C). (A) Detectability index (d') for the bone insert. Detectability index was highest at 60 keV and increased at higher radiation dose and smaller phantom size. Of note, the dashed line indicates the d' of the LBI for the 10 mm lesion as a reference. (B) Detectability index (d') for the iodine insert. Detectability index was highest at 50 keV and increased at higher radiation dose and smaller phantom size. Of note, the dashed line indicates the 30 keV and increased at higher radiation dose and smaller phantom size. Of note, the dashed line indicates the d' of the LBI for the 10 mm lesion as a reference. (C) Detectability index (d') for the polystyrene insert. Detectability index was highest at 70 keV and increased at higher radiation dose and smaller phantom size. Of note, the dashed line indicates the d' of the LBI for the 10 mm lesion as a reference. LBI, linear-blended images.



**Figure 6** Detectability index (d') as a function of VMI-energy and task. Graphs show data for the 26 cm phantom size at 10 mGy and a simulated lesion diameter of 5 mm. Dashed lines depict the d' of the LBI for each insert. Both high-contrast tasks (bone and iodine) demonstrated higher d' at low keVs of 40–80 keV compared to LBI. For the low-contrast task (polystyrene), d' was lower for VMI at 40–60 keV. VMI, virtual monoenergetic imaging; LBI, linear-blended images.

magnitude and noise texture to LBI for VMI at 70–90 keV which confirms prior reports of similar appearance of VMI at 75 keV compared to traditional images at 120 kVp (32). In addition, we found a slight shift to lower frequency noise content at lower radiation dose. To compensate for these low signal conditions, the scanner and reconstruction algorithm applied low-signal corrections, which led to a stronger smoothing during the reconstruction process (32). The increased noise magnitude of low-keV VMI-energies could be reduced in the future by applying advanced denoising techniques, e.g., prior-knowledge-aware iterative denoising (mono-PKAID) (23). PKAID demonstrated decreased image noise compared to the second-generation VMI algorithm used in this study which consecutively improved iodine CNR (23).

## Spatial resolution

Assessment of spatial resolution properties revealed no dependence of the TTF on the radiation dose level, phantom size, or the VMI-energy for both high-contrast tasks (bone and iodine). However, a right shift to higher frequencies of the TTF50 was found for the low-contrast polystyrene insert for low-energy VMI (40–60 keV), indicating higher in-plane spatial resolution. An increase in spatial resolution at low keV-energies has been also described by Greffier et al. in three studies in which an acrylic insert was used. Here, the highest TTF50 values were found for VMI at 40 keV and a shift towards lower frequencies was observed with increasing VMI-energy (24,25,34). The authors hypothesized that this finding was related to changes of the enhancement of the border of the acrylic insert with decreasing VMI-energy which introduced on overshoot on the edge spread function (ESF) curves which improved the TTF (24,34). We observed the same effect for the polystyrene in our study as demonstrated by the increased slopes of the ESF curves at low VMI-energies. We therefore think that this increased spatial resolution is mainly caused by the insert material and not a true property of VMI images of this contrast task. However, despite the measured improvement in spatial resolution, lower d'-values were found for the low-contrast task at 40-60 keV VMI which might be caused by the increased low-frequency noise found in the NPS of these images.

## Detectability

VMI at low-energies (e.g., 40–60 keV) achieved substantially higher d'-values for the high-contrast tasks despite inferior noise properties compared to LBI. We attribute this to the increased CT-attenuation and contrast of bone and iodine at lower energies. This finding is in line with results of former clinical studies that demonstrated benefits using VMI at low-keVs for imaging of contrastenhanced structures, e.g., vascular imaging (35,36). Interestingly, d' increased slightly from 40 to 50 keV for the iodine contrast task before decreasing with increasing VMIenergy. This behavior is comparable to the insert with lower iodine concentration (2 mgI/mL) in the study by Greffier *et al.* (25) while it differs from the insert with higher iodine concentration (4 mgI/mL) for which a decrease of d' was observed for VMI-energies higher than 40 keV (24,25).

As a general observation, our results indicate that the optimization of VMI-energy offers potential for dose reduction. In many cases, d'-values of LBI can be achieved using certain VMI-energies of a lower radiation dose, e.g., for the iodine insert the d' of the LBI at 15 mGy were comparable to the d' of 70 keV-VMI at 5 mGy. This indicates potential for dose reduction if VMI are properly chosen dependent on the clinical task (high *vs.* low-contrast task).

We observed similar trends among the VMI-energies for the three inserts for all simulated lesion diameters with, as expected, increasing d' at increasing lesion diameter. Furthermore, we observed the same trends for all three simulated patient sizes.

The results of our study indicate that the optimal VMIenergy depends on the contrast task. The low-contrast task in our study aimed to emulate a non-enhancing lowcontrast lesion as for example a cystic lesion, a hematoma or a necrotic lesion after therapy. Our findings highlight that the optimal detectability for lesion with these contrast properties differs from highly vascular/strongly iodine enhancing lesions. Interpreting our findings in regards to clinical relevance, we consider the iodine contrast task as the task with the highest clinical impact due to the frequency of contrast-enhanced image studies in diagnostic imaging and the role of iodine-enhancement in lesion detection and characterization. While the iodine concentration in our study was rather high (10 mgI/mL), it was in the reported range of highly vascular tumors as for example hepatocellular carcinoma (37). Based on our results, we suggest VMIs at 50-60 keV as most useful in a clinical context in addition or as a surrogate for LBI yielding comparable or higher d'values for all three contrast tasks at all three sizes. This is comparable to the results of former clinical studies in which low-energy VMIs of 40-60 keV demonstrated improved lesion delineation [e.g., 40 keV in hypoattenuating liver metastasis (38) and improved lesion conspicuity (39), e.g., 50 keV in hypervascular liver lesions (40)]. Furthermore, a comparable VMI-energy of 50 keV was proposed by Zhou et al. who found a greater or similar iodine CNR and iodine detectability compared to traditional images from single-energy CT in an abdominal phantom simulating liver lesions (41) and compared to iodine maps from photon-counting detector CT (42). A difference to our study was the use of a photon-counting detector CT, the comparison of VMI to single-energy images instead of LBI and the use of a channelized Hotelling observer (CHO) for lesion detectability. The results by Zhou et al. and our study promote the standard use of VMIs at 50 or 60 keV for contrast-enhanced imaging which could reduce the complexity of VMI imaging from a workflow perspective in which the user/radiologist typically has to choose from a large number of possible VMI-energies.

# Limitations

First, there are inherent limitations of using phantoms instead of human/patient data. This includes also the shape of the phantom which did not resemble the anthropomorphic shape of a human body. In addition, the phantom modules were homogeneous and did not include heterogeneous texture as typically found in certain human organs. Heterogeneous texture has shown to impact detectability for different reconstruction algorithms (43) and its effect in VMI is unknown. Second, we did not assess the impact of automatic tube current modulation. We purposely deactivated the automatic tube current modulation for this study because we wanted to analyze the impact of size and radiation dose on task-based image quality metrics in a standardized and controlled fashion. Third, the materials of the phantom and inserts did not perfectly emulate human tissues or pathologies. However, the concept of high-contrast task with and without iodine as well as low-contrast tasks is a reasonable extrapolation for common tasks in diagnostic imaging. Forth, we have only investigated one possible tube voltage combination (100/Sn150 kVp) of the dual-source DECT. However, we do not expect significant changes in the trends of task-based image quality observed in our study at lower tube voltage combinations. Fifth, we did not investigate the impact of different reconstruction algorithms, kernels or denoising on the d' among VMIs. Reconstruction algorithms and kernels alter noise texture and spatial resolution which impacts d' dependent on the contrast task. Nevertheless, we hypothesize that the trends among VMI and LBI observed in our study would remain similar.

## Conclusions

In conclusion, results of our study suggest that task-based image quality metrics, e.g., the detectability index, differ among different energies of VMI depending on the contrast task. Detectability increased with increasing radiation dose and decreasing size. An improved detectability index or a reduced radiation dose compared to traditional LBI can be achieved by tailoring the use of VMI-energies to the diagnostic task at hand. Considering clinical relevance of iodine, VMIs at 50–60 keV could be proposed as an alternative to LBI.

## Acknowledgments

The authors thank Mrs. Sarah Euler, MScN, RN for revising the manuscript. *Funding:* None.

#### Footnote

Reporting Checklist: The authors have completed the

MDAR reporting checklist. Available at https://dx.doi. org/10.21037/qims-21-477

*Conflicts of Interest:* All authors have completed the ICMJE uniform disclosure form (available at https://dx.doi.org/10.21037/qims-21-477). The authors have no conflicts of interest to declare.

*Ethical Statement:* The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved. This study conformed to the provisions of the Declaration of Helsinki (as revised in 2013). Ethical approval was not necessary because of the design as phantom study.

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**Cite this article as:** Cester D, Eberhard M, Alkadhi H, Euler A. Virtual monoenergetic images from dual-energy CT: systematic assessment of task-based image quality performance. Quant Imaging Med Surg 2022;12(1):726-741. doi: 10.21037/ qims-21-477 McCollough CH, Fletcher JG. Low kV versus dualenergy virtual monoenergetic CT imaging for proven liver lesions: what are the advantages and trade-offs in conspicuity and image quality? A pilot study. Abdom Radiol (NY) 2018;43:1404-12.

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# Supplementary

#### Table S1 Peak noise frequency as a function of image type and radiation dose

Image tupe	Radi	ation dose, peak noise frequency (m	nm⁻¹)
inage type	5 mGy	10 mGy	15 mGy
Linear-blended images	0.184±0.007 (0%)	0.184±0.007 (0%)	0.173±0.003 (0%)
VMI 40 keV	0.079±0.003 (-57%)	0.084±0.007 (-54%)	0.079±0.007 (-55%)
VMI 50 keV	0.184±0.007 (0%)	0.173±0.013 (-6%)	0.173±0.007 (0%)
VMI 60 keV	0.184±0.007 (0%)	0.173±0.013 (-6%)	0.189±0.013 (+9%)
VMI 70 keV	0.189±0.013 (+3%)	0.173±0.013 (-6%)	0.189±0.015 (+9%)
VMI 80 keV	0.173±0.013 (-6%)	0.178±0.015 (-3%)	0.173±0.007 (0%)
VMI 90 keV	0.168±0.015 (-9%)	0.178±0.015 (-3%)	0.173±0.013 (0%)
VMI 130 keV	0.100±0.007 (-46%)	0.084±0.007 (-54%)	0.079±0.013 (-55%)
VMI 190 keV	0.079±0.000 (-57%)	0.079±0.000 (-57%)	0.079±0.013 (-55%)

Absolute and relative peak noise frequency (f<sub>peak</sub>) values of each VMI-energy compared to the linear-blended images for each of the three radiation doses at the pediatric phantom size (16 cm). Linear-blended images (LBI) served as reference standard. Values are given as mean±standard deviation. Percentage change in noise magnitude of each VMI-energy compared to LBI is given in brackets. VMI, virtual monoenergetic imaging.

#### Table S2 Peak noise frequency as a function of image type and radiation dose

	Radiation dose, peak noise frequency (mm <sup>-1</sup> )				
inage type	5 mGy	10 mGy	15 mGy		
Linear-blended images	0.147±0.007 (0%)	0.163±0.015 (0%)	0.173±0.007 (0%)		
VMI 40 keV	0.079±0.003 (-46%)	0.079±0.003 (-52%)	0.079±0.003 (-55%)		
VMI 50 keV	0.115±0.020 (-21%)	0.163±0.020 (0%)	0.173±0.007 (0%)		
VMI 60 keV	0.136±0.007 (-7%)	0.168±0.020 (+3%)	0.173±0.0013 (0%)		
VMI 70 keV	0.147±0.007 (0%)	0.168±0.020 (+3%)	0.173±0.013 (0%)		
VMI 80 keV	0.136±0.007 (-7%)	0.168±0.020 (+3%)	0.173±0.015 (0%)		
VMI 90 keV	0.131±0.015 (-11%)	0.163±0.015 (0%)	0.173±0.007 (0%)		
VMI 130 keV	0.089±0.007 (-39%)	0.094±0.007 (-42%)	0.110±0.013 (-36%)		
VMI 190 keV	0.079±0.003 (-46%)	0.079±0.007 (-52%)	0.079±0.013 (-55%)		

Absolute and relative peak noise frequency ( $f_{peak}$ ) values of each VMI-energy compared to the linear-blended images for each of the three radiation doses at the large phantom size (36 cm). Linear-blended images (LBI) served as reference standard. Values are given as mean  $\pm$  standard deviation. Percentage change in noise magnitude of each VMI-energy compared to LBI is given in brackets. VMI, virtual monoenergetic imaging.

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	Radia	Radiation dose, average noise frequency (mm <sup>-1</sup> )				
image type	5 mGy	10 mGy	15 mGy			
Linear-blended images	0.274±0.001 (0%)	0.275±0.002 (0%)	0.274±0.001 (0%)			
VMI 40 keV	0.258±0.001 (-6%)	0.259±0.001 (-6%)	0.258±0.001 (-6%)			
VMI 50 keV	0.267±0.001 (-2%)	0.269±0.001 (-2%)	0.268±0.001 (-2%)			
VMI 60 keV	0.273±0.001 (-0%)	0.274±0.001 (-0%)	0.275±0.001 (+0%)			
VMI 70 keV	0.274±0.001 (+0%)	0.275±0.001 (+0%)	0.276±0.002 (+1%)			
VMI 80 keV	0.271±0.001 (-1%)	0.272±0.002 (-1%)	0.272±0.002 (-1%)			
VMI 90 keV	0.267±0.001 (-2%)	0.268±0.001 (-2%)	0.268±0.001 (-2%)			
VMI 130 keV	0.259±0.001 (-5%)	0.258±0.001 (-6%)	0.257±0.001 (-6%)			
VMI 190 keV	0.255±0.001 (-7%)	0.253±0.001 (-8%)	0.253±0.001 (-8%)			

Absolute and relative average noise frequency ( $f_{av}$ ) values of each VMI-energy compared to the linear-blended images for each of the three radiation doses at the pediatric phantom size (16 cm). Linear-blended images (LBI) served as reference standard. Values are given as mean  $\pm$  standard deviation. Percentage change in noise magnitude of each VMI-energy compared to LBI is given in brackets. VMI, virtual monoenergetic imaging.

Table S4 Average noise frequency as a function of image type and radiation dose

Image ture	Radiatio	on dose, average noise frequency (m	m <sup>-1</sup> )
image type	5 mGy	10 mGy	15 mGy
Linear-blended images	0.237±0.002 (0%)	0.264±0.001 (0%)	0.273±0.001 (0%)
VMI 40 keV	0.219±0.001 (-8%)	0.246±0.002 (-7%)	0.255±0.001 (-7%)
VMI 50 keV	0.228±0.001 (-4%)	0.255±0.001 (-4%)	0.264±0.002 (-3%)
VMI 60 keV	0.235±0.001 (-1%)	0.262±0.001 (-1%)	0.270±0.002 (-1%)
VMI 70 keV	0.237±0.001 (+0%)	0.265±0.001 (+0%)	0.273±0.001 (+0%)
VMI 80 keV	0.236±0.001 (-0%)	0.264±0.001 (-0%)	0.272±0.001 (-0%)
VMI 90 keV	0.232±0.001 (-2%)	0.260±0.001 (-2%)	0.269±0.001 (-2%)
VMI 130 keV	0.221±0.001 (-7%)	0.250±0.000 (-6%)	0.258±0.001 (-5%)
VMI 190 keV	0.216±0.001 (-9%)	0.244±0.000 (-8%)	0.253±0.001 (-7%)

Absolute and relative average noise frequency ( $f_{av}$ ) values of each VMI-energy compared to the linear-blended images for each of the three radiation doses at the large phantom size (36 cm). Linear-blended images (LBI) served as reference standard. Values are given as mean  $\pm$  standard deviation. Percentage change in noise magnitude of each VMI-energy compared to LBI is given in brackets. VMI, virtual monoenergetic imaging.



**Figure S1** Noise power spectrum. Noise power spectrum as a function of the image type, radiation dose level, and phantom size for the full frequency range. Overall noise magnitude increased with increasing phantom size and decreasing radiation dose. Furthermore, noise magnitude was higher for 40–60 keV compared to the LBI. Please note the differences in the y-axis scale for the NPS. VMI-energies of 90, 110–120, and 140–180 keV are not displayed because they demonstrated similar shape compared to adjacent energies. LBI, linear-blended images; VMI, virtual monoenergetic imaging.



# Normalized Noise Power Spectrum

**Figure S2** Normalized noise power spectrum. Normalized noise power spectrum as a function of the image type, radiation dose level, and phantom size for the full frequency range. A low frequency peak was observed for low (40–60 keV) and high keVs (130–190 keV). Of note, VMI-energies of 90, 110–120, and 140–180 keV are not displayed because they demonstrated similar shape compared to adjacent energies. VMI, virtual monoenergetic imaging.



**Figure S3** Edge spread function. ESF as a function of the contrast task, image type and radiation dose level for the 36 cm section (A). Magnified graphs with a limited x-axis range are given in (B) to highlight the differences between the VMI-energies for the polystyrene insert. Please note the increase in the slope of the ESF at low VMI-energies of 40–60 keV for the polystyrene insert indicating improved spatial resolution. ESF, edge spread function; VMI, virtual monoenergetic imaging.