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### RESEARCH ARTICLE

MEDICAL PHYSICS

# Realistic total-body J-PET geometry optimization: Monte Carlo study

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#### Abstract

**Background:** Total-body (TB) Positron Emission Tomography (PET) is one of the most promising medical diagnostics modalities, opening new perspectives for personalized medicine, low-dose imaging, multi-organ dynamic imaging or kinetic modeling. The high sensitivity provided by total-body technology can be advantageous for novel tomography methods like positronium imaging, demanding the registration of triple coincidences. Currently, state-of-the-art PET scanners use inorganic scintillators. However, the high acquisition cost reduces the accessibility of TB PET technology. Several efforts are ongoing to mitigate this problem. Among the alternatives, the Jagiellonian PET (J-PET) technology, based on axially arranged plastic scintillator strips, offers a low-cost alternative solution for TB PET.

**Purpose:** The work aimed to compare five total-body J-PET geometries with plastic scintillators suitable for multi-organ and positronium tomography as a possible next-generation J-PET scanner design.

**Methods:** We present comparative studies of performance characteristics of the cost-effective total-body PET scanners using J-PET technology. We

investigated in silico five TB scanner geometries, varying the number of rings, scanner radii, and other parameters. Monte Carlo simulations of the anthropomorphic XCAT phantom, the extended 2-m sensitivity line source and positronium sensitivity phantoms were used to assess the performance of the geometries. Two hot spheres were placed in the lungs and in the liver of the XCAT phantom to mimic the pathological changes. We compared the sensitivity profiles and performed quantitative analysis of the reconstructed images by using quality metrics such as contrast recovery coefficient, background variability and root mean squared error. The studies are complemented by the determination of sensitivity for the positronium lifetime tomography and the relative cost analysis of the studied setups.

**Results:** The analysis of the reconstructed XCAT images reveals the superiority of the seven-ring scanners over the three-ring setups. However, the three-ring scanners would be approximately 2–3 times cheaper. The peak sensitivity values for two-gamma vary from 20 to 34 cps/kBq and are dominated by the differences in geometrical acceptance of the scanners. The sensitivity curves for the positronium tomography have a similar shape to the two-gamma cases, from about 20–28 times, with a maximum value of 1.66 cps/kBq. This can be contrasted with the 50-cm one-layer J-PET modular scanner used to perform the first in-vivo positronium imaging with a sensitivity of 0.06 cps/kBq.

**Conclusions:** The results show the feasibility of multi-organ imaging of all the systems to be considered for the next generation of TB J-PET designs. Among the scanner parameters, the most important ones are related to the axial field-of-view coverage. The two-gamma sensitivity and XCAT image reconstruction analyzes show the advantage of seven-ring scanners. However, the cost of the scintillator materials and SiPMs is more than two times higher for the longer modalities compared to the three-ring solutions. Nevertheless, the relative cost for all the scanners is about 10–4 times lower compared to the cost of the uExplorer. These properties coupled together with J-PET cost-effectiveness and triggerless acquisition mode enabling three-gamma positronium imaging, make the J-PET technology an attractive solution for broad application in clinics.

#### KEYWORDS

J-PET, Monte Carlo simulations, TB PET

### 1 | INTRODUCTION

Positron emission tomography (PET) is a gold standard diagnostic modality enabling metabolic imaging of pathological tissues.<sup>1–3</sup> Presently, the majority of PET machines offer an axial field-of-view (FOV) of approximately 20–25 cm with a single bed position. To perform an image of the entire patient's body, a series of scans acquired with different bed positions is necessary. The new generation of total-body (TB) PET scanners<sup>4–7</sup> allows for simultaneous imaging of the whole human body, presenting new perspectives in dynamic imaging, kinetic modeling,<sup>8–15</sup> positronium lifetime imaging,<sup>16–18</sup> and simultaneous multi-tracer imaging.<sup>19</sup>

The usage of inorganic L(Y)SO scintillators, while popular, results in high costs of the existing TB scanners, estimated to be in the range of about \$10 million or more.<sup>20</sup> The high price reduces the accessibility of TB technology for hospitals and research facilities. To

reduce the TB scanner cost,<sup>9</sup> various approaches have been proposed, including the reduction of the scintillator thickness,<sup>21,22</sup> rearrangement of the scintillators to the sparse configurations,  $2^{3-27}$  use of the BGO crystals combined with the Cherenkov photon signal measurement for timing information<sup>28- $\dot{3}1$ </sup> or the use of plastic scintillators.<sup>32,33</sup> The use of plastic scintillators substantially decreases the price, as they are more than an order of magnitude less expensive than L(Y)SO crystals.<sup>34</sup> Moreover, the cylindrical arrangement of the long scintillator strips allows the positioning of the readouts mainly at the ends of the cylindrical rings in contrast to crystal-based PET detectors where coverage of the full cylindrical surface is necessary. In consequence, the amount of required silicon photomultipliers (SiPMs), which constitute an important part of the overall scanner price, are greatly reduced.

A cost-effective, portable and modular PET scanner (J-PET) with an extended 50-cm long axial field of

view (AFOV) is currently in operation at the Jagiellonian University in Kraków.<sup>35</sup>

The application of the J-PET scanner extends beyond the standard medical two-photon imaging.<sup>33</sup> It provides the capability to conduct multi-gamma tomography studies such as positronium imaging<sup>16</sup> and simultaneous multi-tracer imaging.<sup>19</sup> Furthermore, it is utilized in fundamental physics studies on quantum entanglement<sup>36</sup> and studies of discrete symmetries in nature.<sup>37,38</sup> Additionally, it is used in proton beam range monitoring in hadron radiotherapy,<sup>39–42</sup> and PET data reconstruction methods development.<sup>43,44</sup>

The primary objective of this study is to analyze and compare the performance of five realistic geometry options for designing the new TB modality based on the J-PET modular technology. The main functional goal is to develop a cost-effective prototype designed to leverage the TB scanner technology, enabling for example, multi-organ imaging. Simultaneously, the sensitivity should allow performing positronium mean lifetime tomography which can deliver complementary information to the currently used standardized uptake value image<sup>16,45–48</sup> and parametric modeling.<sup>49,50</sup> For further insights into the potential clinical applications of J-PET technology, detailed information can be found in ref. [34].

The selection of the particular tested designs including scintillator lengths, gaps between detectors and radii is driven by the constraints imposed by the physical properties of currently available scintillators, the shape of the front-end electronics, and photomultipliers. Special emphasis is put on the realism of the modeled geometries, with attention to many details abstracted in previous studies. For example, the previous studies used idealized cylinders with tightly placed scintillators. To make the simulation conditions more realistic, we take into account the size of the front-end electronics, and the gaps between adjacent rings, as well as inactive detector material. It has been shown that larger gaps are feasible for 3D PET<sup>25,27</sup> and can be particularly effective in the design of TB-PET scanners.<sup>26,51</sup> Additionally, the length of the scintillator strips is restricted to 686.4 and 330.0 mm, to improve the time resolution and light yield in the scintillator which is strongly attenuated in longer strips.<sup>52</sup> In consequence, longer scanners are constructed by combining adjacent rings of cylindrical strips.

We also introduce the Wavelength Shifter (WLS) layer which improves the precision of the reconstructed position along the scintillator strip.<sup>52</sup> We developed dedicated GATE modules to handle the details of the new geometry including the WLS. In contrast to previous studies,<sup>32,33</sup> our current work centers on the assessment of the quality of the reconstructed images based on the Monte Carlo simulations of the extended cardiactorso phantom (XCAT). Furthermore, we expand the previously used metrics such as contrast recovery coefficient (CRC) and background variability (BV), by adding the Root Mean Square Error (RMSE), and the Q metric which combines the CRC and BV. Another innovation involves the implementation and application of the bootstrap list-mode method to estimate the metric uncertainty. Our studies are supplemented by the sensitivity curves for the conventional two-gamma tomography, as well as for the positronium mean lifetime tomography.

Based on the performed analysis, the TB J-PET scanner setups are compared. Currently, works toward the construction of the TB J-PET scanner are ongoing.<sup>33,53,54</sup>

### 2 | MATERIALS AND METHODS

## 2.1 | Total-body J-PET scanner geometries

Five TB J-PET scanner configurations were studied. Scanners with varying numbers of rings, the length of the gap between the subsequent rings, scanner radii, and scintillator cross-sections were investigated. The selection of these specific designs, such as scintillator lengths, gaps between detectors, and radius was determined by the constraints imposed by the physical properties of the available scintillators and photomultipliers, dimensions and shape of the front-end electronics, and other materials.

All TB geometry scanners under consideration are based on the J-PET portable module concept — an independent detection unit composed of plastic scintillator strips (see Figure 1 left Panel). The chemical composition of the scintillator corresponds to the commercial EJ230 scintillator, which is used in the existing J-PET scanner prototypes.<sup>16,33</sup> The annihilation photons passing through the plastic scintillator strips interact predominately via Compton scattering. Deposited energy is converted into scintillation light which is then collected at the ends of the scintillators by the SiPMs and read out by fast, customized on-board front-end electronics enabling time-of-flight (TOF) measurement.<sup>55</sup> The modules were placed as closely as possible to the front-end electronics configuration. Each ring consists of 24 modules arranged cylindrically. The length of the scintillator strips is restricted to 686.4 and 330.0 mm, to improve the time resolution and light yield in the scintillator which is strongly attenuated in longer strips.<sup>52</sup> The dependence of time resolution on strip length was incorporated into the simulation model. The longer scanners are constructed by combining adjacent rings of cylindrical strips (see Figure 1 Right Panel). The plastic scintillators are approximately 7 times less dense than LYSO crystals, and hence less effective for registering annihilation photons. We use two layers to compensate for the lower attenuation coefficient of the plastic scintillators. Adding more layers would increase the cost. To enhance the precision of the reconstructed position along the



**FIGURE 1** (Left) Visualization of the single module, made of plastic scintillators (light blue) with the WLS layer (green elements) and the casing (violet - not included in the simulation model). (Right) Visualization of the seven-ring S5 scanner with a total FOV of 243 cm. The length of the scintillators in each ring is equal to 33 cm. The gap between adjacent rings is equal to 2 cm. Two layers of the scanners are shown (yellow and red strips). FOV, field-of-view; WLS, wavelength shifter.

TABLE 1 Scanners properties.

	Scanner geometry						
Property	S1	S2	S3	S4	S5		
Radius (mm)	506	506	425	414.65	414.65		
Axial FOV (mm)	2099.2	2159.2	2099.2	2430	2430		
Scintillator length (mm)	686.4	686.4	686.4	330	330		
Scintillator cross-section (mm)	25 × 5.7	25 × 5.7	25 × 5.7	25 × 6.0	30 × 6.0		
No of adjacent rings	3	3	3	7	7		
Gap between adjacent rings (mm)	20	50	20	20	20		
Price reduction factor	9.6	9.6	9.6	4.3	3.6		

Note: For the scintillator cross-section, the first number indicates the crystal thickness and the second length in the transaxial direction. As a reference point for the price reduction factor, we take the material budget of the uExplorer scanner.

### scintillator strip, each module is equipped with a layer of WLSs. $^{52}$

Table 1 lists the scanner configurations evaluated in this study. In all cases, the modules (the size of the module include scintillators, SiPMs and read-out tables) were placed as close to each other as possible with respect to the electronics configuration. The radius difference between S1–S2 and S3–S5 is determined by the larger module size, which required more space and in consequence significantly greater radius compared to the S3–S5 setups. In both cases, the scintillator cross section is set to fit the size of the SIPM active surface equal to  $6 \times 6 \text{ mm}^2$ .

The selection of these scanner geometries allows for studying the impact of several parameters on the system performance. Scanners S1 and S2 give insight into the influence of the gap between the rings. The 2 cm gap corresponds to the smallest mechanically possible

distance, where all the front-end electronics components are tightly packed, while the 5 cm space (instead of 2 cm) allows for some flexibility in the mechanical construction. The difference between the S1 and S3 modalities consists mainly of the two radius values. The use of a smaller radius permits decreasing the number of readout channels, enhances geometrical angle coverage, and leads to better sensitivity. On the other hand, a scanner design with a larger diameter leaves more space between the modules simplifying the mechanical support. The larger diameter, especially in the case of the TB scanners, has the additional advantage of improving the patient's comfort during the scan, by lowering anxiety and reducing claustrophobia, which is one of the psychological burdens the patient must face during medical examination.<sup>56,57</sup> The S4 and S5 scanners are used to study the effect of the scintillator width. Finally, the S3 and S4 modalities have different crosssections and use different scintillator lengths resulting in changes in timing resolution.<sup>32,33</sup>

The price of the considered J-PET scanners was estimated using the methodology inspired by the work.<sup>8</sup> The overall cost of the TB scanner can be decomposed into (a) the cost of the CT system, (b) the cost of scintillator materials, (c) the cost of the front-end electronics boards, and (d) the cost of the SiPMs. The prices of the electronic boards (c) and CT scanners (a) are assumed to be similar for all TB systems. The plastic scintillators are about 80 times less expensive than L(Y)SO crystals for each 1 cm<sup>3</sup> volume. In addition, the cylindrical arrangement of the long scintillator strips allows the SiPMs only at the ends, reducing their number. For each scanner setup, we calculate the overall volume of the scintillator materials. Moreover, we include WLS layer volume, assuming that the material per volume is 4 times more expensive than the plastic scintillator price. We also estimate the number of required SiPMs by

calculating the area covered by them. Taking into account (b) and (d) terms, we estimate the price reduction factor for J-PET scanner setups. As a reference point, we take the material budget of the uExplorer scanner.<sup>5</sup> Therefore, if a scanner has a price reduction factor equal to 2 it means that it would be two times cheaper than uExplorer in terms of overall SiPMs and scintillator price.

### 2.2 | Monte Carlo simulation parameters

J-PET scanner geometries were modeled using GATE v9.0,<sup>58,59</sup> based on Geant v4.10.7.1.<sup>60</sup> An additional layer of WLSs, which improves the estimation of the axial coordinate of the photon interaction point,<sup>52</sup> was incorporated into the simulation model. The default GATE digitizer code was extended by a dedicated module to allow the simulation of the signals registered in the WLS layers. In all the simulations the em livermore polar physics list was used, which is the standard choice for all J-PET-related MC simulations.33 The tracking of optical photons was not included in the simulations to reduce the computation time. In the XCAT and conventional sensitivity simulations, the  $\beta^+$ source decay is not simulated directly and simulation starts at the emission of the back-to-back photon pairs.

### 2.3 | Phantoms

We simulated XCAT,<sup>61</sup> the extended sensitivity<sup>33</sup> and the positronium sensitivity phantoms. The activity of the male XCAT phantom<sup>61</sup> was prepared<sup>62,63</sup> to mimic the <sup>18</sup>F-FDG distribution within the human body. Additionally, two hot spheres (diameter = 1.0 cm) positioned in the lung and in the liver were incorporated in the phantom simulations. The contrast between the hot region and the background activity was set to 16:1 and 3:1 for the lungs and liver, respectively. The overall activity of the phantom was equal to 50 MBq and the acquisition time was set to 600 s.

The extended sensitivity phantom consists of the 2m linear source positioned in the center, along the long axis of the cylindrical scanner. For each simulation, the activity of 10 MBq and measurement time of 1000 s were used.

For the aforementioned scanners, the back-to-back 511 keV gamma source has been used.

Additionally, the positronium sensitivity phantom consists of a 183 cm-long linear source situated in the transaxial center of the scanner. In the simulation, the <sup>44</sup>Sc-like source was modeled by using a parapositronium source with enabled deexcitation photon of energy set to 1160 keV.

# 2.4 | Photon detection, coincidence formation and energy threshold

The front-end electronic response was modeled by the GATE digitizer which converts photon interaction in the scintillator into deposited energy and detection time.

The temporal and energy resolution of the scanner was described by the phenomenological parameterization of the experimental resolutions. The energy  $\sigma(E)$ resolution dependence is parameterized as a fraction which reflects the experimentally determined relation for the plastic scintillator strips.<sup>64</sup> The simulated photon registration time is smeared, event by event, by replacing the event registration time  $t_r$  by the value obtained from the normal distribution  $N(t_r, \sigma_t)$ , where  $\sigma_t$ corresponds to the temporal resolution of the scintillator strip. Similarly, the registration position along the scintillator strip (z position) is smeared, event by event, by replacing the registered photon position z by the value obtained from the normal distribution  $N(z, \sigma_z)$ , where  $\sigma_z$ corresponds to the positional uncertainty along the scintillator strip of the scanner. For all the simulations the resolution parameters, that is, the position along the strip and the time were set to  $\sigma_z$  equal to 2.12 mm<sup>33</sup> and  $\sigma_t$ equal to 100 ps (scanners S1, S2 and S3) or 77 ps (scanners S4 and S5).<sup>65</sup> respectively. Discrepancies in time smoothing reflect the expected time resolution change due to the size of the scintillator strip length.<sup>33,66,67</sup>

In the case of the XCAT and extended sensitivity phantoms the coincidence time window of 3 ns was used. In contrast to the inorganic detectors, in plastic scintillators, the photons deposit their energy mainly via Compton scattering. The energy selection threshold  $E_{thr}$  of 200 keV was set to reduce the fraction of the background coincidence events,<sup>32,33</sup> for which at least one of them undergoes the scattering in the phantom before being registered in the scanner. Only coincidence pairs with the registration photon energy above the energy threshold are considered. This selection criterion corresponds to the optimal selection cut applied in the analysis of the data obtained with the J-PET prototype allowing for the reduction of scattering in the patient and the detectors.<sup>32,33,64</sup>

For the positronium imaging sensitivity analysis, simulated interactions were further processed by the external coincidence sorter allowing triple coincidence formation. A valid positronium coincidence was defined as two photons originating from the annihilation registered in the deposited energy range from 200 to 350 keV, combined with the third photon registration with the deposited energy above 350 keV. The selected upper energy value lies above the Compton edge of 340 keV, which corresponds to the maximum possible deposited energy by the 511 keV annihilation photons. Such triple had to be in coincidence within a 3-ns time window. Additionally, to obtain only true coincidences, conditions such

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as: originating from the same annihilation-deexcitation event or lack of prior interactions of any of the three photons were applied.

### 2.5 | Data preselection and preparation

For the image reconstruction analysis, only true coincidences were taken into account.

The background and contrast 3D region-of-interests (ROIs) were used for the image quality metrics determination. ROIs for the quantitative analysis did not include the whole hot region but were morphologically eroded to overcome the partial volume effects. Fifteen background ROIs were chosen separately for the liver and lung regions. Both, hot sphere and background ROIs, are composed of 52 voxels. To avoid the partial volume effect, an additional constraint, that the background ROI cannot be neighboring the region of different activities, was applied.<sup>68</sup>

### 2.6 | PET image reconstruction

The image reconstruction was performed with the CAS-ToR software package.<sup>69</sup> TOF List Mode - Maximum Likelihood Expectation Maximization algorithm with 150 iterations was used. The reconstruction voxel size was  $2.5 \times 2.5 \times 2.5$  mm<sup>3</sup>. TOF resolution kernel was modeled as the Gaussian function. Sensitivity and attenuation corrections were included. The multi-Siddon projector with 10 rays was used. Reconstructed images were smoothed with 3D Gaussian post-filter with  $\sigma$  set to 2.5 mm. No additional resolution modeling was used in the reconstruction process.

### 2.7 | TOF resolution optimization

The CASTOR software provides the possibility to use the shift-invariant TOF kernel only. This approach can be sub-optimal, especially while dealing with large FOV scanners, where the kernel shape can change significantly in the axial direction.<sup>70,71</sup> However, the aim of these studies is the relative performance comparison between scanner configurations, and the usage of the shift-invariant TOF kernel will affect all the investigated setups in a rather equal manner.

In the J-PET scanners, the TOF resolution is affected by the additional hit registration uncertainty along the axial direction of the strip that effectively smears the overall TOF resolution (see Figure 2). More details can be found in the supplementary materials. As a consequence, it is expected that the optimal width of the shift-invariant Gaussian kernel will be broader than the one determined based solely on the scintillator time resolution properties. Therefore in the first step,



**FIGURE 2** TOF uncertainty sources in the J-PET scanner. Apart from the uncertainty along the line of response (marked in red), additional distortion due to the hit registration resolution along the plastic scintillator (green) is present. Example lines of responses are shown in magenta. J-PET, Jagiellonian positron emission tomography; TOF, time-of-flight.

we performed an investigation to select an optimal shift-invariant Gaussian kernel width. The studies were repeated for all setups, to ensure that the common kernel can be chosen. The selected kernel parameters were applied in all subsequent image reconstruction studies.

# 2.8 | System sensitivity and image quality metrics

The performance of the scanners has been evaluated based on several criteria including the sensitivity profiles and image quality metrics.

The sensitivity of the scanner S is defined as the rate of detected true coincidences (counts/s) per unit of the radioactivity concentration. The Monte-Carlo determined ( $S_{MC}$ ) sensitivity in the peak, was compared with the calculated theoretical ( $S_{theor}$ ) value. For that, the geometrical acceptance, detection efficiency of the photon pair, the fraction of events accepted after applying the energy window and the factor accounts for the holes and inactive detector components were considered. In the Supplementary Materials extended explanation of the theoretical sensitivity calculation is given.

The evaluation of the reconstruction performance is based on the metrics defined in the NEMA NU 2–2018 norm for image quality assessment.<sup>72</sup> The procedure is to choose two types of ROIs within the reconstructed image and determine their statistical properties. The first ROI corresponds to the expected high activity (*hot*) signal region and the second ROI corresponds to low activity background region(s) ROI. The CRC for a given ROI is defined as:

$$CRC = \frac{C_S - C_B}{C_B} : \frac{a_S - a_B}{a_B},$$
 (1)

where  $C_S$ ,  $C_B$  is the average number of counts determined for signal and background ROI, and  $a_S$ ,  $a_B$  are the signal and background activities, respectively.

The BV is defined as a standard deviation ( $S_B$ ) calculated for the background ROI normalized to the average counts in the background region:

$$\mathsf{BV} = \frac{\mathsf{S}_B}{C_B}.$$
 (2)

We inspected the additional metric Q, which combines the information from both, CRC and BV, and is defined as<sup>43</sup>:

$$Q = |CRC - 1| + BV.$$
(3)

The *Q* value range is given by:  $Q \in [0, \infty)$ . For the perfect image reconstruction in terms of CRC and BV, one expects 1 and 0 for CRC and BV, respectively. By definition, *Q* would also be equal to 0.

We defined the RMSE between two images  $I_1$  and  $I_2$  is defined as:

RMSE[
$$I_1, I_2$$
] =  $\frac{1}{N} \sqrt{\sum_{k=1}^{N} (I_1[k] - I_2[k])^2}$ , (4)

where N is the total number of voxels, respectively.

In our studies, the activity emission map was used as a ground-truth reference image. Before the RMSE calculation, the compared reference and reconstructed images were first normalized to the maximum. Then, the median intensities were calculated for both. Background activity and whole phantom areas were used to calculate medians. Subsequently, the ratio between medians was calculated and finally, the original image was scaled by the ratio.

### 2.9 | Metric uncertainty estimation

We use the bootstrap resampling method<sup>73,74</sup> to assess the uncertainty of the calculated metrics. Our implementation follows the list-mode-based nonparametric approach proposed in the PET context by the work<sup>75</sup> and further discussed in the articles,<sup>76,77</sup> in which a new sample is formed by randomly choosing events with replacement from the original coincidence list obtained from the MC simulations. For each distinctive scenario defined by phantom, scanner setup and parameter settings, 20 bootstrapped samples were prepared and reconstructed. For each reconstructed image (bootstrapped) the corresponding quality metrics are determined. Finally, the uncertainties are estimated from the bootstrap distribution of quality metrics.



**FIGURE 3** Sensitivity profiles for tested TB J-PET geometries. J-PET, Jagiellonian positron emission tomography; TB, total-body.

**TABLE 2** Theoretical ( $S_{theor}$ ) and Monte Carlo-calculated ( $S_{MC}$ ) sensitivity in the peak of the sensitivity profile for the source positioned in the scanner center.

Туре	S <sub>theor</sub> (cps/kBq)	S <sub>MC</sub> (cps/kBq)
S1	17.61	19.95
S2	17.21	19.50
S3	22.69	24.44
S4	23.21	26.85
S5	30.57	34.24

### 3 | RESULTS

## 3.1 | Sensitivity for two-gamma tomography

Sensitivity plots for all simulated scanners are shown in Figure 3. The characteristic "spikes" visible in the sensitivity profiles correspond to the centers of the strips and the gaps between adjacent rings. The sensitivity values in the peak are compared with the analytical calculations in Table 2. The Monte Carlo-based results are in reasonable agreement with the analytical calculations. The slight underestimation of the analytical calculations compared to the Monte Carlo ones can be explained by the estimation method of the packing factor, which accounts for holes and inactive detector components without taking into account the depth of the crystal in the estimation. A detailed explanation of the analytical estimation method can be found in the Supplementary Materials. Overall, the greatest sensitivity has been found for the scanner S5 with the maximum at the level of 34 cps/kBq. The lowest values are observed for the scanners S1 and S2 with the maximum at the level of 17 cps/kBq. The observed difference is a simple consequence of the higher geometrical coverage of the S5 scanner due to its smaller radius and larger AFOV.



FIGURE 4 Multi-gamma imaging sensitivity profiles for tested TB J-PET geometries. J-PET, Jagiellonian positron emission tomography; TB, total-body.

**TABLE 3** Monte Carlo-calculated  $(S_{MC_{2+1}})$  sensitivity in the peak of the sensitivity profile for the source 2+1 positioned in the scanner center.

two-gamma te	omography and	alyzes.		
-		-		

Туре	S <sub>MC2+1</sub> (cps/kBq)
S1	0.72
S2	0.68
S3	1.01
S4	1.24
S5	1.66

	XCAT [10 <sup>7</sup> ]				
Туре	True	Scatter	Random		
S1	5.7	3.9	6.0		
S2	5.5	3.7	5.8		
S3	8.2	6.1	9.1		
S4	9.7	7.2	10.6		
S5	12.6	9.5	13.5		

# 3.2 | Sensitivity for positronium tomography

The Monte Carlo-based sensitivity plots and sensitivity in peak values for all simulated scanners are shown in Figure 4 and Table 3, respectively.

The profiles are characterized by the same trend as for the two-gamma sensitivity. The greatest values are observed for the S5 scanner (1.66 cps/kBq in peak). On the other hand, the lowest values are observed for the S2 scanner with the maximum at the level of 0.68 cps/kBq. The sensitivity (in the peak) for positronium tomography is about 20–30 times lower than the sensitivity for the two-gamma imaging.

### 3.3 | Number of coincidences

The numbers of coincidences registered for two-gamma tomography for each scanner and XCAT phantoms are of the order of  $10^7-10^8$  and are given in Table 4. The greatest number is found for the S5 scanner

and the smallest for the S1 scanner. It is an effect of the increased geometrical acceptance and detector efficiency for the thicker (S5 scanner) scintillator layer.

### 3.4 | Choice of the optimal TOF kernel

The nominal TOF resolution estimated based on the time-smearing parameters set in the simulations with the scanner S5 corresponds to FWHM of about 166 ps (see Supplementary Materials). The comparison of the images reconstructed with various Gaussian kernel widths is presented in Figure 5. The visual inspection reveals that the reconstruction with smaller kernel widths (TOF = 115 ps and TOF = 230 ps) generates images with higher background and noise levels. Furthermore, the contrast between hot regions and the background is clearer for the images reconstructed with a broader TOF width. These conclusions are confirmed by analysing the Q distribution as a function of iteration and applied TOF kernel width presented in Figure 6. The Q is determined for hot spots. It is found that in all cases



**FIGURE 5** Simulated (REF label) and reconstructed XCAT phantom images (TOF label) for five different Gaussian TOF kernel widths for the sagittal (top panel) and axial (center and bottom panel) views. The center and bottom panels show the slice through the hot spot in the lungs and liver, respectively. PET images are overlayed onto CT scans. Given slices are for S5. 50<sup>th</sup> iteration images are shown. PET, positron emission tomographs; TOF, time-of-flight; XCAT, extended cardiac-torso phantom.



FIGURE 6 The Q metric distributions for lungs (panel A) and liver (panel B) for the scanner S5.

the best Q values are observed for the TOF kernel width broader than 230 ps. For five out of six cases (excluding hot spot positioned in the liver) the lowest (the best) Q are found for the TOF = 365 ps and TOF = 500 ps. The TOF = 115 ps obtained the highest (worse) Q characteristic among all the presented cases. It is also noticeable that for all the images for 50<sup>th</sup> iteration the Q metric reaches the plateau. The same trend was observed for other scanners. Corresponding plots are included in the Supplementary Materials.

Taking into account both, the visual inspection and quantitative results, the range of the TOF kernel width between 365 to 750 ps gives the best results. The

shapes of the metric plots are very similar and they are preserved for all the scanners. In the further image quality analysis, we proceed with the images reconstructed with the common Gaussian kernel width set to 500 ps.

### 3.5 | Image quality

Figure 7 presents the images for all the scanners after 50 iterations. The visual inspection indicates that the background noise is higher for the S1, S2 and S3 scanners. It is particularly visible in the shoulder girdles and



**FIGURE 7** Simulated (REF panel) and reconstructed (S1–S5) XCAT phantom images for five different scanner types for the sagittal (top panel) and axial (center and bottom panel) views. The center and bottom panels show the slices through the hot spot in the lungs and liver, respectively. PET images are overlayed onto CT scans. For each scanner, the 50<sup>th</sup> iteration image is shown. PET, positron emission tomographs; TOF, time-of-flight; XCAT, extended cardiac-torso phantom.

in the axial slices with hot spots in the lungs and the liver. At the same time, the contrast values are similar for all investigated scanners.

A comprehensive analysis of CRC, BV, Q, and RMSE metrics is presented in Figure 8. The greatest CRC value is observed for the lungs, although the CRC variation for each ROI among the scanners does not exceed two standard deviations. Vast discrepancies are observed for the BV metrics. Here, scanners S4 and S5 show statistically significant superiority for both the liver and the lung regions over the rest of the scanners. At the same time, the worst results are found for the scanners with the greatest radius - S1 and S2. Above mentioned findings are reflected in the Q metric. As in the case of the BV, the S5 scanner is characterized by the lowest Q metric for both - the liver and the lungs. For the RMSE metric, no significant differences were found between the scanners in the case of lesions located in the lung. For the liver, it has been found that scanners S3-S5 outperform the S1 and S2 scanners, although the difference is small. The performance of scanners S1 and S2 is significantly worse than the other scanners. The obtained quantitative results are in agreement with the qualitative, visual inspection.

### 4 | DISCUSSION

The most important characteristics determined for the studied scanners are gathered in Table 5.

In the presented study two-gamma sensitivity profiles for five TB J-PET scanner geometries (Tables 1 and 5) were determined. The peak sensitivity values vary from 20 to 34 cps/kBg and are dominated by the differences in the geometrical acceptance of the scanners. The maximum peak sensitivity of 34 cps/kBg was found for the scanner S5. This value is slightly lower than the result reported in our previous study,<sup>33</sup> where for the 200 cm ideal scanner the sensitivity in peak is equal to 38 cps/kBq. The difference can be explained by the larger radius of the investigated setup (41.4 cm vs. 39 cm) and the inclusion of the gaps between rings and adjacent plastic scintillators. Contrasted with the values reported for the state-of-the-art TB scanners: uExplorer (191.5 cps/kBq) and PennPET (55 cps/kBq),<sup>8</sup> the J-PET scanner sensitivity is lower, however, it can be seen as a significant improvement concerning the current 16–26 cm long PET systems.45

The sensitivity curves for the positronium tomography have a similar shape to the two-gamma sensitivity profiles. Since they are calculated based on the triple coincidences formed by the two annihilation and one deexcitation photons, the values in the peak are much lower compared to the two-gamma cases, from about 28 times lower for the S1 and S2 scanners to about 20 times lower for the S5 scanner. One can observe, that the sensitivity for triple coincidences rises much faster as a function of AFOV than the corresponding dependence for the two-gamma case. The sensitivity in the peak for positronium imaging rises by 130% comparing



**FIGURE 8** CRC (first column), BV (second column), Q (third column) and RMSE (fourth column) characteristics for the liver (top row) and lungs (bottom row) regions calculated based on the reconstructed XCAT phantom images for all five scanners. Shaded regions indicate the one standard deviation region. BV, background variability; CRC, contrast recovery coefficient; RMSE, Root Mean Square Error; XCAT, extended cardiac-torso phantom.

TABLE 5	Price reduction factor compared to the Explorer material budget, sensitivity in the peak for the two-gamma ( $S_{MC}$ ) and the
two+one ( $S_{M}$	$C_{2+1}$ ) sources positioned in the scanner center, CRC, BV, and Q metrics for the 150 <sup>th</sup> iteration in lungs and liver areas.

Туре	Price factor	S <sub>MC</sub> (cps/kBq)	S <sub>MC2+1</sub> (cps/kBq)	CRC <sub>lungs</sub>	CRC <sub>liver</sub>	<b>BV</b> <sub>lungs</sub>	BV <sub>liver</sub>	<b>Q</b> <sub>lungs</sub>	Q <sub>liver</sub>
S1	9.6	19.95	0.72	0.68(4)	0.54(6)	0.57(3)	0.30(2)	0.89(5)	0.75(6)
S2	9.6	19.50	0.68	0.83(4)	0.51(6)	0.53(2)	0.30(2)	0.70(5)	0.79(6)
S3	9.6	24.44	1.01	0.79(4)	0.52(6)	0.57(3)	0.26(1)	0.78(5)	0.75(6
S4	4.3	26.85	1.24	0.84(4)	0.53(6)	0.57(3)	0.24(1)	0.73(5)	0.71(6
S5	3.6	34.24	1.66	0.80(3)	0.58(5)	0.48(3)	0.21(1)	0.68(4)	0.64(5

Note: The uncertainty (up to the first significant number) of the value is given in the parenthesis.

the S5 to S1 scanner. On the other hand, the two-gamma sensitivity in the peak gain raises by only 70% from S1 to S5.

The highest peak sensitivity for positronium imaging is estimated for the S5 scanner and is equal to 1.66 cps/kBq. This value can be contrasted with the estimated sensitivity of the positronium imaging in the peak of 0.06 cps/kBq of the J-PET modular scanner, which has been used to reconstruct the first positronium mean lifetime image of the human brain in vivo.<sup>78</sup> This makes the J-PET TB modality a well-suited scanner for multi-photon imaging.<sup>17,34</sup>

The quantitative analysis of the reconstructed image quality was performed based on simulations of the XCAT phantom. The analysis of the reconstructed images confirms the feasibility of multi-organ imaging with J-PET TB technology. The visual inspection reveals the superiority of the seven-ring scanners (S4 and S5) over the three-ring setups (S1, S2 and S3) (Figure 7). In particular, the noise level is smaller for the scanners S4 and S5. This is confirmed by the guantitative results shown in Figure 8 and in Table 5. The BV value for the S5 is the lowest for both lesions. BV values are of a similar order as the CRC ones. Thus, both BV and CRC will have similar importance in the Q metric results. For this case, the Q value indicates the scanners S4 and S5 are the optimal geometries for a TB J-PET. The RMSE characteristics for the lungs do not elevate any of the scanners to outperform others. However, in case of the liver lesions the S3, S4, and S5 scanners mimic the simulated reference image better than the scanners S1 and S2.

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In our study, the simulated scenarios use the same overall activity between investigated scanners and the acquisition time for all the scanners to better reproduce the real conditions. As a consequence, the reconstructed images and calculated metrics differ in the number of registered coincidences. It is plausible that the effect of the reduced BV can be fully explained by the higher statistics acquired by the scanners S4 and S5.

Note that the presented reconstruction and analysis protocols require further optimization for potential clinical application and it is out of the scope of this paper.

### 4.1 | Limitations

In the image reconstruction process, the sensitivity and attenuation corrections were included. Image quality could be further improved by the addition of other correction factors such as point spread function (PSF) or depth-of-interaction (DOI) modeling. Indeed, the efforts to develop a dedicated J-PET system response matrix are ongoing.<sup>70</sup> Also, no selection criteria for the obliqueness of the accepted line-of-responses were applied. As shown in our previous study, it could improve the contrast and background of the reconstructed images.<sup>79</sup> However, the more accurate system matrix modeling or application of the obliqueness selection criteria would improve the overall metric values for example, contrast, but would not change the relative trends we observed among the scanner setups.

In our study, only the true coincidences were used for the image reconstruction. Further studies must be carried out to develop the scatter and random correction methods for the J-PET-based TB scanners. Additionally, the spatial resolution, scatter fraction and count rate performance as per NEMA performance protocol are out of the scope of this paper.

Lastly, the study does not involve visual or quantitative positronium lifetime imaging. Those aspects will be addressed in a dedicated article under preparation.

### 5 | CONCLUSIONS

We performed comparative studies of five realistic, twolayer TB J-PET scanners, based on the Monte Carlo simulations of the XCAT phantom. The overall performance was quantified in terms of CRC, BV, Q and RMSE metrics for the two-gamma tomography. In addition, the two-gamma and positronium imaging sensitivity curves were determined. The results show the feasibility of multi-organ imaging of all the systems to be considered for the next generation of TB J-PET designs. Among the scanner parameters, the most important ones are related to the axial FOV coverage, and the influence of the time resolution depending on the scintillator length and positional uncertainty due to different material thicknesses.

Other parameters have a secondary effect on the reconstruction guality within the considered values range. They are dominated by the parameters related to the overall registration efficiency such as total length of the active material or scanner radius. It can be concluded that the image quality increases for the higher twogamma sensitivity scanners and is manifested mainly in the lower BV values due to the higher statistics acquired. A similar effect was observed in analyzing the data from the uExplorer TB PET scanner.<sup>68</sup> The two-gamma sensitivity and XCAT image reconstruction analyzes in terms of the quality metrics, together with the visual inspection of the reconstructed images show the advantage of longer, seven-ring S4 and S5 scanners. However, the improvement comes with a higher price. As estimated, the cost of the scintillator materials and SiPMs which constitute a majority of the TB price is more than two times higher for the S4, and S5 modalities compared to the three-ring solutions. Still, the relative cost for all the scanners is about 10 to 4 times lower compared to the cost of the uExplorer modality.

The importance of the high-sensitivity systems becomes more pronounced in the case of the positronium mean lifetime tomography which requires the registration of triple gamma coincidences. The determined positronium sensitivity values make the J-PET TB modality a well-suited scanner for positronium lifetime imaging.<sup>17,78,80,81</sup> It is worth underlining that the positronium lifetime tomography is well suited to be performed on other high-sensitivity, large FOV scanners such as Biograph Vision Quadra or uExplorer. However, it requires operating on the single acquisition mode that permits to registration of multi-gamma coincidences. This condition can pose problems, especially for the system approved for clinical usage.

The combined properties together with its costeffectiveness and triggerless acquisition mode enabling simultaneous acquisition and processing of the two- and multi-gamma coincidences for both conventional PET and positronium imaging, make the J-PET technology an attractive solution for broad application in clinics.

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### CONFLICT OF INTEREST STATEMENT

P. Moskal holds patents for PET from plastic scintillators and positronium imaging.

### DATA AVAILABILITY STATEMENT

Authors will share data upon request to the corresponding author.

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### SUPPORTING INFORMATION

Additional supporting information can be found online in the Supporting Information section at the end of this article. **How to cite this article:** Baran J, Krzemien W, Parzych S, et al. Realistic total-body J-PET geometry optimization: Monte Carlo study. *Med Phys.* 2025;1-15. https://doi.org/10.1002/mp.17627