**ORIGINAL ARTICLE** 



# The impact of iterative reconstruction protocol, signal-to-background ratio and background activity on measurement of PET spatial resolution

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## Abstract

**Objectives** The present study aims to assess the impact of acquisition time, different iterative reconstruction protocols as well as image context (including contrast levels and background activities) on the measured spatial resolution in PET images. **Methods** Discovery 690 PET/CT scanner was used to quantify spatial resolutions in terms of full width half maximum (FWHM) as derived (i) directly from capillary tubes embedded in air and (ii) indirectly from 10 mm-diameter sphere of the NEMA phantom. Different signal-to-background ratios (SBRs), background activity levels and acquisition times were applied. The emission data were reconstructed using iterative reconstruction protocols. Various combinations of iterations and subsets (it × sub) were evaluated.

**Results** For capillary tubes, improved FWHM values were obtained for higher it  $\times$  sub, with improved performance for PSF algorithms relative to non-PSF algorithms. For the NEMA phantom, by increasing acquisition times from 1 to 5 min, intrinsic FWHM for reconstructions with it  $\times$  sub 32 (54) was improved by 15.3% (13.2%), 15.1% (13.8%), 14.5% (12.8%) and 13.7% (12.7%) for OSEM, OSEM + PSF, OSEM + TOF and OSEM + PSF + TOF, respectively. Furthermore, for all reconstruction protocols, the FWHM improved with more impact for higher it  $\times$  sub.

**Conclusion** Our results indicate that PET spatial resolution is greatly affected by SBR, background activity and the choice of the reconstruction protocols.

Keywords Positron emission tomography · FWHM · Spatial resolution · Iterative reconstruction · TOF · PSF

## Introduction

The high specificity and sensitivity of oncological FDG PET/CT imaging have made it a mainstay of modern clinical imaging [1, 2]. Spatial resolution is one of the key

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parameters impacting PET performance and interpretation in oncological imaging [3]. The proposed method for measuring the spatial resolution is straightforward in the NEMA standard [4] which is based on filtered back projection (FBP) algorithm and point source embedded in the air without

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scattering media. While the FBP algorithm is linear and desirable for systems with wide transaxial coverage [5, 6], the presence of gaps in sinogram data challenges FBP [7, 8]. Nowadays, iterative reconstruction algorithms are popular in PET imaging [9, 10]. Furthermore, iterative reconstruction algorithms have been improved by incorporating point spread function modeling (PSF) and time of flight (TOF). Reconstruction algorithms can affect the quantification of PET/CT images [11–13].

PET images reconstructed with PSF modeling and/ or TOF result in improved PET-based quantification and can increase the SNR and contrast for lesions [14–16]. In patients with colorectal liver metastases, Rogasch et al. [17] showed that quantitative evaluation can be influenced when using either PSF or TOF protocols for radiotherapy or follow-up purposes in different tumor-to-background ratios. They also stated that PSF protocols showed the higher maximum standardized uptake value (SUV<sub>max</sub>) at higher contrast, whereas in lower contrast TOF algorithms provided the higher  $SUV_{max}$ . It also illustrated that PSF modeling can improve the spatial resolution as well as diminish partial volume effects and provide more accurate SUV estimation [18–20]. Armstrong et al. [21] reported that PSF protocols can significantly increase the SUV measurement. They suggested that improvement of spatial resolution can be helpful in distinguishing normal and abnormal patterns in oncology [22, 23]. In general, improved spatial resolution can lead to accurate PET quantification as well as lesion detectability especially in small lesions with low uptake [24, 25].

A study [26] on patients with lung cancer reported that various PET biomarker have various sensitivities to reconstruction protocols. A previous work [27] investigated the influence of reconstruction and acquisition parameters on local noise in experimental phantoms and concluded that lower number of iterations or subsets can decrease the noise variance up to 80% in PET/CT images. Furthermore, they stated that higher filter values can reduce image noise up to 25%. Recent studies [28–31] have also shown that noise levels and artifacts can be substantially increased with decreasing acquisition times.

At this time, the measured FWHM in air cannot reflect the real measured FWHM values in practical situations, given the fact that the presence of background activity and contrast levels along with different reconstruction protocols can affect the measured FWHM in clinical PET/ CT imaging. To address these challenges and achieve a more realistic spatial resolution measurement in clinical practice, we also used a 10 mm-diameter sphere of NEMA phantom for FWHM estimation. In the present study, only as a first step, the measured FWHM for the capillary tube in air in various reconstruction protocols was evaluated. In the next step, the impact of contrast, various acquisition times and background activities on the intrinsic FWHM in scattering media was also evaluated with consideration of different reconstruction (PSF and/or TOF) protocols for 10 mm-diameter sphere of NEMA phantom.

# Materials and methods

#### **Experimental measurement**

FWHM was measured for both capillary tubes in air and the NEMA phantom. In the first step, seven capillary tubes (inner diameter: 1 mm, length: 60 mm) filled with total activity 2 MBq of <sup>18</sup>F-FDG were positioned at scanner FOV according to the following locations (in centimeters): (x, y, z): (-20, 0, 0), (-10, 0, 0), (0, 0, 0), (10, 0, 0), (20, 0, 0), (0, 0, -5.9) and (0, 0, 5.9). In the second step, the three spheres of the NEMA phantom (10, 17 and 28 mm diameter) were filled with a solution of <sup>18</sup>F-FDG, using signal-to-background ratios (SBRs) of 2:1, 4:1 and 8:1. Two background activity concentrations (2.38 and 4.78 kBq/ml) were also used. The smallest sphere size (10 mm diameter) was utilized for the evaluation of the FWHM value.

#### Data acquisition and image reconstruction

In this study, we used a Discovery 690 PET/CT scanner (GE Healthcare, Milwaukee, Wisconsin, USA) equipped with a 64-slice CT scanner. This PET scanner uses lute-tium yttrium oxyorthosilicate (LYSO) crystals with a 70 cm transaxial FOV. The coincidence time window of the PET scanner is 4.9 ns and timing resolution of TOF is 555 ps.

The PET data for both capillary tubes in air and the inhouse-NEMA phantom were reconstructed with various reconstruction algorithms: (1) OSEM = OSEM with no PSF or TOF, (2) OSEM + PSF = OSEM with PSF only, (3), OSEM + TOF = OSEM with TOF only and (4) OSEM with PSF and TOF = OSEM + PSF + TOF. In capillary tubes, Gaussian post-smoothing filter of 0, 2, 3, 4, 5 and 6 mm in full width at half maximum (FWHM) was applied. For the NEMA phantom, no post-smoothing filter was used. The reconstruction parameters were 2 and 3 iterations, and 16 and 18 subsets for all reconstruction methods. The scans for all the SBRs used in this study were performed with a bed duration of 5 min for both the capillary tubes and the NEMA phantom. Additionally, for the NEMA phantom with SBR = 2:1, various acquisition times (ranging from 1 to 5 min with a step of 1 min) were also used for various reconstruction protocols. CT imaging was obtained when 100 kVp, 80 mA and 1 s rotation time was utilized.

#### Assessment strategy

Spatial resolution was obtained as the FWHM in both radial and axial directions for each capillary tube. A parabolic fit was used to determine the maximum intensity pixel. Finally, linear interpolation between adjacent pixels specified the half-maximum points. Individual intrinsic FWHM values for different locations of capillary tubes were obtained by plotting FWHM<sub>Measured</sub> (FWHM measured in various reconstruction protocols) vs FWHM<sub>Filter</sub> (FWHM of Gaussian filters with various sizes) and a linear fit to the data was used to extrapolate to a postreconstruction smoothing filter width of 0 mm (Eq. 1). This approach is preferable for improved accuracy [32] than using only the data with no post-smoothing. In the next step, FWHM<sub>intrinsic</sub> (FWHM of the PET system) was obtained by squared summation of all individual intrinsic values.

$$FWHM_{Measured}^{2} = FWHM_{Intrinsic}^{2} + FWHM_{Filter}^{2}$$
(1)

For the 10 mm-diameter sphere of the NEMA phantom, we determined intrinsic FWHM by applying the method in Hofheinz et al. [33]. This method performs convolution of a 3D isotropic Gaussian with the sphere geometry and derives the radial activity profile of a homogeneous sphere. The analytical solution contained some parameters such as true activity concentration within the sphere, the radius of a sphere, background level and FWHM of the Gaussian function. In this process, non-linear least squares fitting was used to determine FWHM of the Gaussian function. The remaining parameters were fixed to their known values. This method considers approximately similar values for the axial and transaxial resolution. The relative FWHM difference (%) was also applied for comparison of various iterative reconstruction protocols on the FWHM value.

### Results

Table 1 summarizes the individual FWHM in various capillary tube locations embedded in the air when the lowest and the highest it × sub values were used for different reconstruction protocols. In each method, the smallest intrinsic FWHM was seen for the center of the FOV. In x, the individual intrinsic FWHM for the PSF algorithms (OSEM + PSF and OSEM + PSF + TOF) showed smaller values for higher it × sub, with the differences being greater in comparison to non-PSF protocols (OSEM and OSEM + TOF). It is also worth noting that the relative difference (%) between minimum and maximum of individual FWHM across different locations was 29.7% (28.4%), 34.1% (44.9%), 31.4% (32.4%) and 34.3% (44.6%) for OSEM, OSEM + PSF, OSEM + TOF and OSEM + PSF + TOF, respectively, when it × sub was 32 (54).

Figure 1 depicts intrinsic FWHM values as derived from capillary tubes embedded in the air in various reconstruction methods for a range of it × sub reconstructions. The higher it × sub yielded smaller FWHM values with more impact for PSF algorithms relative to non-PSF algorithms. The relative differences (%) between the minimum and maximum of FWHM values among different reconstruction algorithms were 13.6%, 18.0%, 24.4% and 27.0% when different it × sub (32, 36, 48 and 54) was considered, respectively.

The square of the measured FWHM vs the square of the FWHM of the Gaussian filter is plotted in Fig. 2. The relative differences (%) of the measured FWHM values for the minimum and maximum size of the post-smoothing filter when it  $\times$  sub = 32 (54) were 28.0% (30.6%), 30.4% (43.2%), 29.1% (33.0%) and 32.8% (42.8%) for OSEM, OSEM + PSF, OSEM + TOF and OSEM + PSF + TOF, respectively.

Our findings related to intrinsic FWHM of the NEMA phantom for the various it  $\times$  sub are shown in Fig. 3. The relative difference (%) between the minimum and maximum of intrinsic FWHM with increase in it  $\times$  sub from 32 to 54, when 2:1, 4:1 and 8:1 SBR was applied, were 6.85%,

Table 1 Individual intrinsic FWHM values for different capillary tube locations embedded in the air and reconstruction protocols

Protocols		Location $(x, y, z)$						
Reconstruction method	It×sub	(- 20, 0, 0) (mm)	(- 10, 0, 0) (mm)	(0, 0, 0) (mm)	(10, 0, 0) (mm)	(20, 0, 0) (mm)	(0, 0, - 5.9) (mm)	(0, 0, 5.9) (mm)
OSEM	32	2.41	2.26	1.75	2.28	2.46	2.49	2.48
	54	2.32	2.06	1.66	2.10	2.31	2.28	2.27
OSEM + PSF	32	2.35	2.07	1.56	2.09	2.37	2.35	2.33
	54	1.36	1.33	1.19	1.34	1.39	2.16	2.13
OSEM+TOF	32	2.36	2.17	1.68	2.19	2.39	2.43	2.45
	54	2.21	1.83	1.52	1.84	2.23	2.25	2.23
OSEM+PSF+TOF	32	2.33	1.68	1.53	1.73	2.32	2.20	2.18
	54	1.32	1.27	1.18	1.29	1.36	2.13	2.12

**Fig. 1** Intrinsic FWHM derived from capillary tubes embedded in the air for various reconstruction protocols as a function of iterations × subsets





**Fig. 2** Measured FWHM for capillary tubes embedded in the air as a function of post-smoothing Gaussian filter for different reconstruction protocols; **a** it  $\times$  sub=32, **b** it  $\times$  sub=54

8.88% and 7.33% for OSEM, 6.50%, 9.34% and 24.0% for OSEM + PSF, 6.12%, 11.6% and 9.16% for OSEM + TOF, and 7.67%, 14.7% and 21.6% for OSEM + PSF + TOF, respectively.

Variation of intrinsic FWHM in the NEMA phantom with SBR of 2:1 was evaluated when different acquisition times were applied (Fig. 4). The higher acquisition time yields improved intrinsic FWHM values. By increasing acquisition times from 1 to 5 min, intrinsic FWHM for it × sub = 32 (54) was improved by 15.3% (13.2%), 15.1% (13.8%), 14.5% (12.8%) and 13.7% (12.7%) for OSEM, OSEM + PSF, OSEM + TOF and OSEM + PSF + TOF, respectively.

Figure 5 illustrates the impact of background variation on the intrinsic FWHM for the NEMA phantom when SBRs of 2:1 and 8:1 were used. For both low and high background activity and all reconstruction protocols, the FWHM improved when it × sub increased. The relative differences (%) between the minimum and maximum intrinsic FWHM values for low (high) background activity was 5.28% (6.85%), 3.54% (6.50%), 5.00% (6.12%) and 5.23%(7.67%) for OSEM, OSEM + PSF, OSEM + TOF and OSEM + PSF + TOF, respectively, when it × sub increased from 32 to 54 for 2:1 SBR and 7.17% (7.33%), 21.2%(24.0%), 8.86% (9.16%) and 19.5% (21.6%) for 8:1 SBR.

To evaluate the impact of the increasing it  $\times$  sub, the SNR (calculated as mean/SD) was measured for various SBRs (Fig. 6). An increase in it  $\times$  sub from 32 to 54 for OSEM, OSEM + PSF, OSEM + TOF and OSEM + PSF + TOF led to the SNR decreasing by 15.0%, 9.60%, 10.2% and 7.31%, respectively, for 2:1 SBR; 13.2%, 7.21%, 12.1% and 8.74%, respectively, for 4:1 SBR; and 21.9%, 13.9%, 19.1% and 14.2%, respectively, for 8:1 SBR.



Fig. 3 Intrinsic FWHM measured from the NEMA phantom in various reconstruction protocols as a function of iterations  $\times$  subsets; **a** SBR=2:1, **b** SBR=4:1 and **c** SBR=8:1



Fig. 4 Intrinsic FWHM derived from NEMA phantom for 1, 2, 3, 4 and 5 min acquisition time when SBR is 2:1; **a**  $it \times sub=32$ , **b**  $it \times sub=54$ 

## Discussion

In clinical PET/CT studies, the diagnostic quality is affected by the spatial resolution and noise levels of the image. Higher noise level can also effectively degrade spatial resolution and result in poorer accuracy. The choice of inappropriate reconstruction protocols [34–36] and low background activity [37] can lead to increased noise levels. Furthermore, the use of varying contrasts in spatial resolution measurement leads to contradictory measurements among studies [38]. To address these challenges, we assessed the influence of various reconstruction parameters, contrast and background activities for OSEM, OSEM + PSF, OSEM + TOF and OSEM + PSF + TOF for both capillary tubes embedded



Fig. 5 Intrinsic FWHM derived from NEMA phantom when background activity levels were 2.38 kBq/mL and 4.78 kBq/mL. SBR=2:1;  $\mathbf{a}$  it×sub=32,  $\mathbf{b}$  it×sub=54; SBR=8:1;  $\mathbf{c}$  it×sub=32,  $\mathbf{d}$  it×sub=54

in the air and the NEMA phantom for measurement of FWHM in PET/CT images.

The PSF algorithm leads to better as well as more uniform spatial resolution throughout the FOV and can improve the image quality, due to incorporation of additional information about the detector system response within the system matrix of the iterative reconstruction algorithm [39]. At the same time, the more advanced reconstruction model of PSF algorithm needs more iterations to adequately reconstruct images. Our findings in capillary tubes depicted that the larger distance to the center of FOV results in a degraded individual FWHM with less impact on PSF algorithms versus to non-PSF algorithms (Table 1), as would be expected due to parallax effects. Although PSF algorithms can lead to improved individual FWHM values in different locations of scanner FOV relative to non-PSF algorithms, actually these algorithms are greatly sensitive to the choice of the reconstruction parameters (Table 1).

We also observed that intrinsic FWHM measurements in capillary tubes were improved by increase in it  $\times$  sub (Fig. 1). The dependency of FWHM on reconstruction parameters is in agreement with previous studies showing that spatial resolution measurements can be affected by the number of iterations [38, 40]. In Fig. 1 with increase in it  $\times$  sub from 32 to 54, the improvement in FWHM was 7.28%, 26.9%, 9.19% and 21.6% for OSEM, OSEM + PSF, OSEM + TOF and OSEM + PSF + TOF, respectively, which is in line with the findings of Lodge et al. [32] that demonstrated that FWHM values were not more affected by increasing the iteration numbers when applying the OSEM + TOF reconstruction algorithm (less than or equal to 5%). However, their reconstruction parameters showed some difference when compared to our parameters.

Our study revealed that (Fig. 2), with increase in the post-smoothing filter in capillary tubes, FWHM value was increased for various reconstruction protocols that are in line with previous studies [41, 42]. In addition, more attention must be applied to choosing filter size of higher it  $\times$  sub when PSF protocols are applied. It seems interesting that when 5 mm post-smoothing filter was applied, and it  $\times$  sub was 32 (54), the relative difference between OSEM and OSEM+PSF+TOF for the square of the measured FWHM was 15.1% (25.7%), respectively.

The non-linearity and the non-negativity constraint of the iterative reconstruction algorithms were a paramount cause for contrast-dependent spatial resolution [43, 44]. We observed that, for 10 mm sphere diameter of the NEMA phantom, intrinsic FWHM values improved for higher SBR



Fig. 6 Comparison of the SNR in various reconstruction protocols for 10 mm diameter sphere of NEMA phantom. The charts represent the SNR vs iterations  $\times$  subsets for a SBR = 2:1, b SBR = 4:1 and c SBR = 8:1

and higher it × sub for all reconstruction protocols (Fig. 3). Furthermore, significant variation for intrinsic FWHM among different protocols was also seen with increase in SBR in the specified it×sub. So for it×sub=54, the relative difference between OSEM + TOF and OSEM + PSF + TOF was 5.19%, 6.51% and 22.9% when 2:1, 4:1 and 8:1 SBR was applied (Fig. 3). For the phantom study performed by Rogasch et al. [45], noteworthy improvements were also reported when using PSF algorithms especially at high contrast.

It notifies that, in 2:1 SBR, with increase in acquisition time from 1 to 3 min, improvement for intrinsic FWHM was observed for both lower and higher it  $\times$  sub (32 and 54); however, nearly the same value was obtained for individual protocols with acquisition time  $\geq$  3 min to 5 min. Moreover, OSEM + PSF + TOF protocol revealed the best value for intrinsic FWHM among various protocols in our study (Fig. 4). In a recent study, Noto et al. [46] have evaluated the influence of PET acquisition duration on lesion detectability and diagnostic performance. They found that shorter acquisition times (equal to or less than 90 s) resulted in lower image quality as well as lower lesion detectability.

Our results showed that PSF protocols resulted in more variation for intrinsic FWHM in 10 mm sphere size of the NEMA phantom when it x sub was increased from 32 to 54, for both low and high activity background and SBR; higher differences were seen for higher activity background and SBR (Fig. 5). In general, improved intrinsic FWHM was also seen for higher activity background and SBR with more impact for higher it x sub. Moreover, we found that using OSEM + PSF + TOF algorithm can lead to improving FWHM values for both lower and higher background activities and it  $\times$  sub relative to other reconstruction algorithms, in conformity with previous studies [47, 48]. Although further studies focusing on analyzing the detectability in PET images are still required, a better image resolution (i.e., FWHM) has the potential of improving the medical diagnosis of small lesions that can be typically missed, such as early stage tumors, metastatic sites, or small nodules. Previous studies have shown that improving PET spatial resolution can be beneficial in the diagnosis of cancer, e.g., prostate cancer [49].

It can be seen that SNR values decreased by increasing  $it \times sub$  for all reconstruction algorithms in all SBRs (Fig. 6), which is attributable to the resulting noise enhancements [50]. The FWHM improvement is notable enough to accept the moderate SNR decrease by increasing  $it \times sub$ , especially in PSF algorithms. However, on the other hand, our results suggest that more attention must be paid to selection of  $it \times sub$  in higher SBRs, specifically if applying non-PSF algorithms.

Some limitations of our study are that all measurements for capillary tubes were done with no background (cold or warm scattering media) and phantom studies only considered a warm background for all FWHM measurements.

The present work indicates that PET spatial resolution is greatly affected by SBR, background activity and the choice of the reconstruction protocols. We would like to emphasize that FDG avid is different for various cancer with a different type of pathology. For example, bronchoalveolar carcinoma and adenocarcinoma in the lung are not very FDG avid in contrast to diffuse large B-cell lymphoma, follicular lymphoma and squamous cell carcinoma. So it seems various types of cancer can be illustrated with different SBR in the same organ. The distribution of FDG is also different among the human organ (for example, higher uptake in the liver and lower uptake in the lung). It is important to be aware of the lesion size, background activity and type of cancer along with reconstruction protocols for clinical interpretation. Taking into consideration the current results for protocol selection and interpretation in oncologic imaging can improve the accuracy of lesion characterization, in particular in small and low-uptake lesions, and lead to proper clinical interpretation.

# Conclusion

Our results demonstrated that spatial resolution in PET images can be related to the SBR, background activity and the choice of the reconstruction protocols. Improvement in spatial resolution can be clearly seen for PSF compared to non-PSF methods when higher it × sub and SBR are present. In addition, higher variations were seen for high background activities and higher SBR when it × sub was increased. Furthermore, less variation in spatial resolution can be observed among different protocols by increasing the acquisition time when higher it × sub was evaluated. Nearly consistent spatial resolutions were observed by increasing acquisition times  $\geq 3$  min for specific it × sub and reconstruction protocols.

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## **Compliance with ethical standards**

**Conflicts of interest** The authors declare that they have no conflict of interest.

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