



Improved [⁶⁸Ga]Ga-PSMA-11 image qualities reconstructed by total variation regularized expectation maximization on total-body PET/CT

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Background: Total variation regularized expectation maximization (TVREM) reconstruction algorithm on the image quality of gallium (⁶⁸Ga) prostate-specific membrane antigen-11 ([⁶⁸Ga]Ga-PSMA-11) total-body positron emission tomography/computed tomography (PET/CT).

Methods: Images of a phantom with small hot sphere inserts and the total-body PET/CT scans of 51 prostate cancer patients undergoing [⁶⁸Ga]Ga-PSMA-11 were reconstructed using TVREM with 5 different penalization factors between 0.09 and 0.45 and for 20-, 40-, 60-, 120-, and 300-second acquisition, respectively. As a comparison, the same data were also reconstructed using the ordered subset expectation maximization (OSEM) with 3 iterations, 20 subsets, and 300 second acquisition. The contrast recovery coefficients (CRC) and background variability (BV) of the phantom, the tumor-to-background ratios (TBR), the contrast recovery (CR) ratio, the image noise of the liver, and maximum standard uptake value (SUV_{max}) of the lesions were calculated to evaluate the image quality. The clinical performance of the images was evaluated by 2 radiologists with a 5-point scale (1-poor, 5-excellent).

Results: The TVREM reconstructions groups with 120 second acquisition and the penalization of 0.27 to 0.45 showed the best performance in terms of CR, TBR, image noise, and the gain of SUV_{max} compared to that obtained in the OSEM 300 second group. Even the image noise of the TVREM 120 second group with a penalization factor of 0.27 and 0.36 was comparable to the OSEM 300 second group; the lesions' SUV_{max} increased by 28% whereas the image noise decreased by 5% and 14%, respectively. The TVREM 120 second group with a penalization factor of 0.36 (5.00±0.00) had the highest qualitative score that equaled OSEM and TVREM for the 300 second (P>0.05) group.

Conclusions: Our study has shown the potential of the TVREM reconstruction algorithm with optimized penalization factors to achieve comparable [⁶⁸Ga]Ga-PSMA-11 total-body PET/CT image quality with a shorter acquisition time, compared with the conventional OSEM reconstruction algorithm.

Keywords: Image quality; prostate-specific membrane antigen; reconstruction algorithm; total-body positron emission tomography/computed tomography (PET/CT); uEXPLORER

Submitted Dec 06, 2022. Accepted for publication May 26, 2023. Published online Jul 11, 2023.

doi: 10.21037/qims-22-1341

View this article at: <https://dx.doi.org/10.21037/qims-22-1341>

Introduction

Prostate-specific membrane antigen (PSMA) positron emission tomography (PET) is increasingly being applied to the imaging of prostate cancer (PCa) (1), which is the third most common cause of cancer death in Europe. In contrast to computed tomography (CT), magnetic resonance imaging (MRI), and choline-based PET imaging, [^{68}Ga]Ga-PSMA PET has achieved improved detection performance by taking advantage of the specific biological characteristics of PSMA expression upregulated in PCa cells of varying disease stages (2). Afshar-Oromieh *et al.* showed that [^{68}Ga]Ga-PSMA PET has better PCa detection performance compared to [^{18}F]F-fluoromethylcholine PET (3). Correspondingly, Pfister *et al.* (4) found that [^{68}Ga]Ga-PSMA PET performed better than [^{18}F]F-fluoroethylcholine PET in individuals with biochemical recurrence. Studies have also highlighted the advantage of [^{68}Ga]Ga-PSMA in high detection accuracy of the prostate primary tumor, metastasis (5), and tumor recurrence (6). In recent years, targeting [^{68}Ga]Ga- or [^{18}F]F-labeled PET agents to PSMA has become increasingly essential. [^{68}Ga]Ga-PSMA-11 (syn. [^{68}Ga]Ga-PSMA-HBED-CC), and the theranostic agents [^{68}Ga]Ga-PSMA-617 and [^{68}Ga]Ga-PSMA-I&T are the most extensively utilized [^{68}Ga]Ga-labelled PSMA ligands for PET imaging (7,8). [^{18}F]F-DCFBC (9,10), [^{18}F]FDCFPyL (11), and [^{18}F]F-PSMA 1007 are some of the agents that have been labeled with [^{18}F]F (12). In this study, we aimed only to investigate [^{68}Ga]Ga-PSMA-11.

Currently, statistical iterative reconstruction methods are the most widely used image reconstruction methods and the ordered subset expectation maximization (OSEM) algorithm is the gold standard. OSEM algorithms approach the acquired image by successive updated approximations, repeated until the difference between the projections of the reconstructed image and the actual recorded one falls below a specific level. The OSEM algorithm has a limited number of iterations and subsets to suppress image noise, which is a balance between noise and accuracy. This early stop leads to a bias in the final image estimate toward the initial image and to a decrease in contrast recovery (CR), signal-to-noise ratio (SNR), and image quality, which is partly accountable

for the ineffective convergence of the algorithm. This may generate suboptimal image quality and inaccuracies in a quantitative assessment (13,14).

Total variation regularized expectation maximization (TVREM), a novel Bayesian penalized likelihood (BPL) reconstruction algorithm, can complete convergence while limiting image noise (15) and preserving edges (16) compared to the OSEM algorithm, due to the application of regularization strength parameter (β) that is added to the likelihood function. Thereby, it may further improve the sensitivity and accuracy in quantitative evaluation and shorten acquisition time (17) or reduce administrated dose. The penalization function is a difference and sum between neighboring voxels, which incorporates the pixel-to-pixel total variation, global noise equivalent counts, and local sensitivity profile. Until recently, abundant studies have shown promising results on [^{68}Ga]Ga-PSMA conventional PET for BPL (18,19). The BPL reconstruction algorithm (Q.CLEAR) proposed by GE Healthcare (Chicago, IL, USA) claims to enhance image accuracy, and has a superior SNR to that of the conventional iterative reconstruction algorithm, according to quantitative evaluation (20,21). Ter Voert *et al.* reported an optimal SNR of β values between 400 and 550 for [^{68}Ga]Ga-PSMA clinical scanning (18). However, the previous studies were performed on conventional PET/CT scanners with a standard axial field of view (AFOV) of 30 cm which limit the system sensitivity.

To overcome the limitation of low sensitivity and short AFOV in current clinical PET scanners, a 194-cm-long PET/CT system for total-body imaging (uEXPLORER; United Imaging Healthcare, Shanghai, China) was developed. Compared with conventional scanners, the massively increased sensitivity of the uEXPLORER substantially improves the PET image quality through a high SNR that supports the high spatial and temporal resolution and also provides much better lesion detection and region of interest (ROI) quantification results, which can be utilized to shorten the acquisition time while maintaining comparable image quality and lesion detectability in oncological studies (22).

The [^{68}Ga]Ga has shown different uptake patterns due to the different positron energies, positron ranges, background activities, tumor-to-background ratios (TBR) (23), and

Table 1 Patient characteristics

Characteristics	Value
Age (years)	68.75±7.35 [50, 82]
Height (m)	1.70±0.05 [1.60, 1.83]
Weight (kg)	67.87±9.84 [51, 93]
Body mass index (kg/m ²)	23.39±3.02 [16.28, 30.12]
Uptake time (min)	55±7 [45, 82]
Injected dose (MBq)	134.68±23.71 [87.34, 206.52]
Injected dose per kg (MBq/kg)	1.98±0.18 [1.59, 2.42]
Serum PSA (ng/mL)	29.48±35.99 [0.02, 172.09]
Treatment-naïve patients (n)	34

The values were presented as mean ± SD [range]. PSA, prostate-specific antigen; SD, standard deviation.

pharmacodynamics in contrast to [¹⁸F]F-FDG PET. To our knowledge, no previous study had evaluated the [⁶⁸Ga]Ga-PSMA-11 image quality reconstructed with TVREM on total-body PET. Therefore, the goal of this study was to evaluate the image quality of [⁶⁸Ga]Ga-PSMA-11 on total-body PET and explore the optimal regularization parameter β in the TVREM algorithm to achieve better image quality.

Methods

Patients

A total of 51 patients [age 68.75±7.35 years, weight 67.87±9.84 kg, with a mean serum prostate-specific antigen (PSA) level of 29.48±35.99 ng/mL] who had been referred to undergo [⁶⁸Ga]Ga-PSMA-11 total-body PET/CT were retrospectively enrolled.

The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). The study was approved by the Ethics Board of Renji Hospital, School of Medicine, Shanghai Jiao Tong University and informed consent was provided by all the patients. The patient information is displayed in *Table 1*. The selection criteria for patients were based on the following: (I) a surgical history of PCa or proven biopsy results; (II) a feasible serum PSA test; (III) the discovery of PSMA-positive malignant lesion/s on PET images. There were no adverse effects observed after injection of [⁶⁸Ga]Ga-PSMA-11. In all reconstruction groups, a total of 84 PSMA-avid lesions were identified: 46 (55%) lesions in the soft tissue, 27 (32%) lesions in the lymph node, and 11 (13%) lesions in the bone.

Data acquisition

All 51 cases underwent [⁶⁸Ga]Ga-PSMA-11 total-body PET/CT scan using a digital time-of-flight (TOF) PET/CT scanner (uEXPLORER, United Imaging Healthcare). The scan was performed approximately 55 minutes after intravenous injection of [⁶⁸Ga]Ga-PSMA-11 according to patient weight (1.98±0.18 MBq/kg). The routine clinical PET/CT protocol was applied with 5 minutes acquisition (total body), 600 mm transaxial field of view (FOV), 192×192 matrix, and 2.886 mm slice thickness with TOF and point-spread-function model, and standard corrections such as decay, scatter, normalization, random, attenuation, and dead time applied. The images were reconstructed with OSEM (3 iterations, 20 subsets, and 3 mm Gaussian postprocessing filter) and TVREM (5 penalization factors: 0.09, 0.18, 0.27, 0.36, and 0.45) respectively using 20-, 40-, 60-, 120-, and 300-seconds duration for the first part of the original scanning data acquisition from list-mode. We named these 30 groups O20, O40, O60, O120, and O300 for OSEM with simply 20-, 40-, 60-, 120-, and 300-second data; R20.09 to R20.45 for TVREM with 20 second acquisition and penalization factors of 0.09, 0.18, 0.27, 0.36, and 0.45, and the same rule applies to the naming of other groups (*Table S1*).

Quantitative evaluation of images

Image analysis was performed by an experienced nuclear medicine physician on the advantage workstation (uWS-MI R004, United Imaging Healthcare). To ensure consistency in the size and position of the drawing while drawing a volume of interest (VOI), the workstation was loaded with images that were reconstructed using various algorithms. The VOI on the liver was delineated by placing a 3 cm diameter sphere on the uniform tissue area in the right upper lobe, and the mean standard uptake value (SUV_{mean}) and standard deviation (SD) were also measured for each patient. The image noise level was calculated by SD over SUV_{mean}.

The ROIs around lesions were drawn manually and divided according to their maximum standard uptake value (SUV_{max}) in O300 reconstruction (<15 vs. ≥15), and localization (bone, lymph nodes, and soft tissue). For each lesion, the SUV_{max} was calculated and normalized by the ratio of SUV_{max} for TVREM to that for O300. The TBR and CR ratio were calculated respectively to evaluate the image quality. To calculate TBR, lesion SUV_{max} was divided by SUV_{mean} of the background (liver), and we

Table 2 Image grading

Categories	Noise	Lesion detectability
1	Poor	Not available
2	Marked	Poor
3	Routine clinical diagnosis available	Average
4	Clinical diagnosis irrelevant	Good
5	Almost none	Excellent

also defined CR by comparing the TBR of the TVREM reconstruction (numerator) to the TBR of the reference O300 reconstruction (denominator), according to the formula below:

$$CR = \frac{(SUV_{max} / SUV_{mean_bkgnd}) - 1}{(SUV_{max_ref} / SUV_{mean_bkgnd_ref}) - 1} \quad [1]$$

In the formula, SUV_{max} is obtained from the lesion, SUV_{mean_bkgnd} represents SUV_{mean} from the liver background ('bkgnd'), and 'ref' indicates the reference O300 reconstruction.

Qualitative evaluation of images

The reconstructed images were evaluated by 2 experienced nuclear radiologists independently on the advantage workstation (uWS-MI R004, United Imaging Healthcare) based on a 5-point scale. The scoring criteria are summarized in *Table 2*. The reviewers blindly rated the images and were unaware of the order and type of reconstruction methods. All images were anonymized, and the reading sequence was randomized to reduce the bias. We also calculated the SNR to verify our image-scoring results.

Statistical analysis

The SUV of O300 served as the reference for the comparison between different reconstruction groups. The nonparametric Friedman test was used to examine the difference in liver SUV_{mean} , SD, and lesion SUV_{max} between O300 and the other groups. The image quality scores of different reconstruction groups were compared with the nonparametric Friedman test. Bonferroni-Holm correction was used to adjust the P-value, which controlled the familywise error rate imposed by multiple comparisons. The inter-rater agreement was measured by Cohen's κ . Data analysis was carried out using commercial software

(SPSS 23.0; IBM Corp., Armonk, NY, USA) and graphics generated by GraphPad Prism 8 software (GraphPad Software Inc., San Diego, CA, USA). A P value of <0.05 was considered statistically significant.

Phantom study

Phantom preparation

For quantitative analysis of [^{68}Ga]Ga-PSMA-11 PET/CT images, a National Electrical Manufacturers Association (NEMA) image quality (IQ) phantom was used in this study (24,25). A total of 6 hot spheres with diameters of 10-, 13-, 17-, 22-, 28-, and 37-mm were placed in the phantom, which were filled with a 4-fold background activity. According to the NEMA standard, the phantom was filled with 8.94 kBq/mL of background activity at the beginning of data acquisition.

Phantom data acquisition

The phantom was placed horizontally on the bed to ensure that the 6 spheres in the total-body PET/CT were located at the center of Unit 3 (uEXPLORER, United Imaging Healthcare). A CT scan was obtained first for attenuation correction, followed by a 5-minute PET scan. PET raw data were collected in list mode. All images were reconstructed using a 192×192 matrix, a FOV of 600 mm, a 3 mm Gaussian filter, a slice thickness of 2.886 mm, TOF, and the point spread function (PSF). The OSEM (3 iterations with 20 subsets) and TVREM (5 penalization factors: 0.09, 0.18, 0.27, 0.36, and 0.45) were applied to list-mode data with durations of 20-, 40-, 60-, 120-, and 300-second, which were consistent with our clinical studies, and named in the same rules (*Table S1*).

Phantom data evaluation

As illustrated in *Figure S1*, different ROIs were placed in reconstructed PET images for quantitative comparison. A total of 6 spherical ROIs were placed on the 6 spheres, and 12 ROIs were drawn as the background reference. The NEMA NU-2 2018 standard was used to calculate the contrast recovery coefficients (CRC) and background variability (BV) (*Appendix 1*) (24).

Results

Quantitative analysis of images

The CRs for TVREM groups with smaller penalization factors were higher than those of OSEM and TVREM

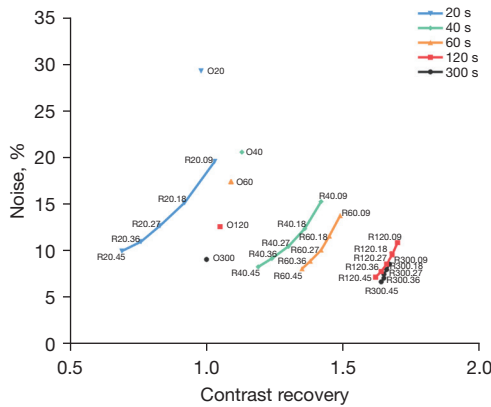


Figure 1 The plot of contrast recovery and image noise with different reconstruction settings. For each reconstruction time, both CR and image noise increased with smaller penalization factors of TVREM. The TVREM groups were considered to have better performance than the OSEM groups. CR, contrast recovery; TVREM, total variation regularized expectation maximization; OSEM, ordered subset expectation maximization.

groups with larger penalization factors (*Figure 1*). For the same duration of the list-mode data, the TVREM groups had higher CRs than OSEM except for R20.18 to R20.45, in which the image noise was decreased as the penalization factors increased (*Figure 1*). The image noise for the groups of R40.45, R60.36, R60.45, R120.27 to R120.45, and R300.09 to R300.45 was smaller than that of O300, yet only differences in Group R120.45 ($P < 0.001$), R300.36 ($P = 0.011$), and R300.45 ($P < 0.001$) were statistically significant.

The image noise and the normalized SUV_{max} were decreased as the penalization factors increased (*Figures 1, 2A*, and *Table S2*). At 40 seconds, the image noise of R40.09 to R40.27 decreased significantly (all $P < 0.05$), whereas the lesions SUV_{max} increased 15.24–19.05% compared to O40. The R60.09 to R60.45 groups all had significantly decreased image noise (all $P < 0.05$) whereas the lesions SUV_{max} were increased by 18.27–22.72% compared to O60. The R120.18 to R120.45 groups also had lower image noise (all $P < 0.05$) and higher lesions SUV_{max} (increase of 26.73–27.72%) compared to O120. In contrast to O300, the image noise of R300.36 and R300.45 decreased significantly (all $P < 0.05$) whereas the SUV_{max} of lesions increased by 26%.

Compared to the O300 group, the image noise for the groups of R40.45, R60.36, R60.45, R120.27, R120.36, and R300.09 to R300.27 were lower with no statistically significant difference observed (all $P > 0.05$), which were considered equivalent groups to O300. Moreover, the

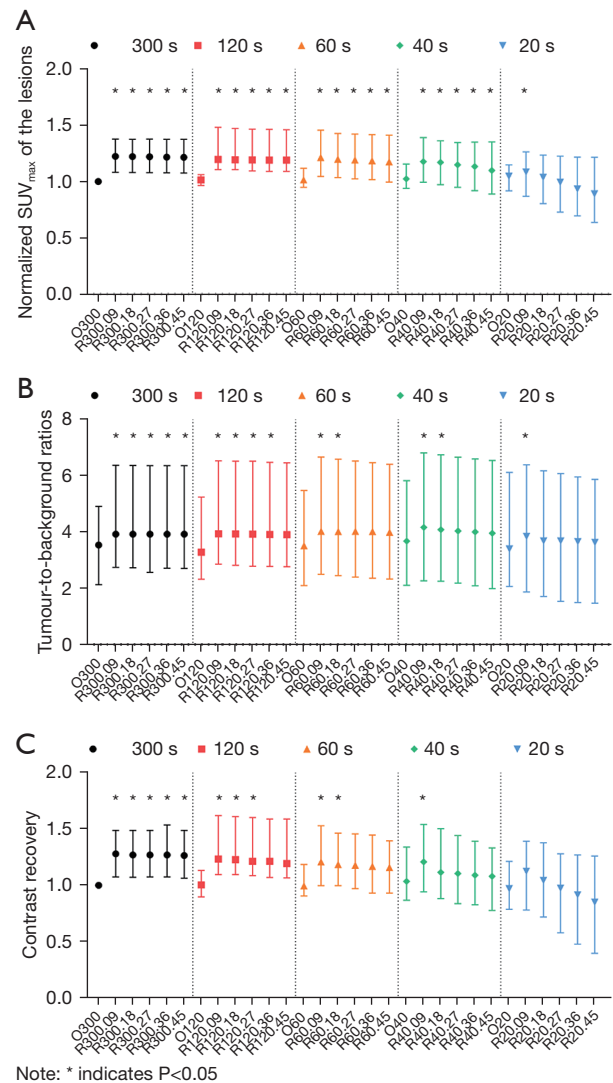
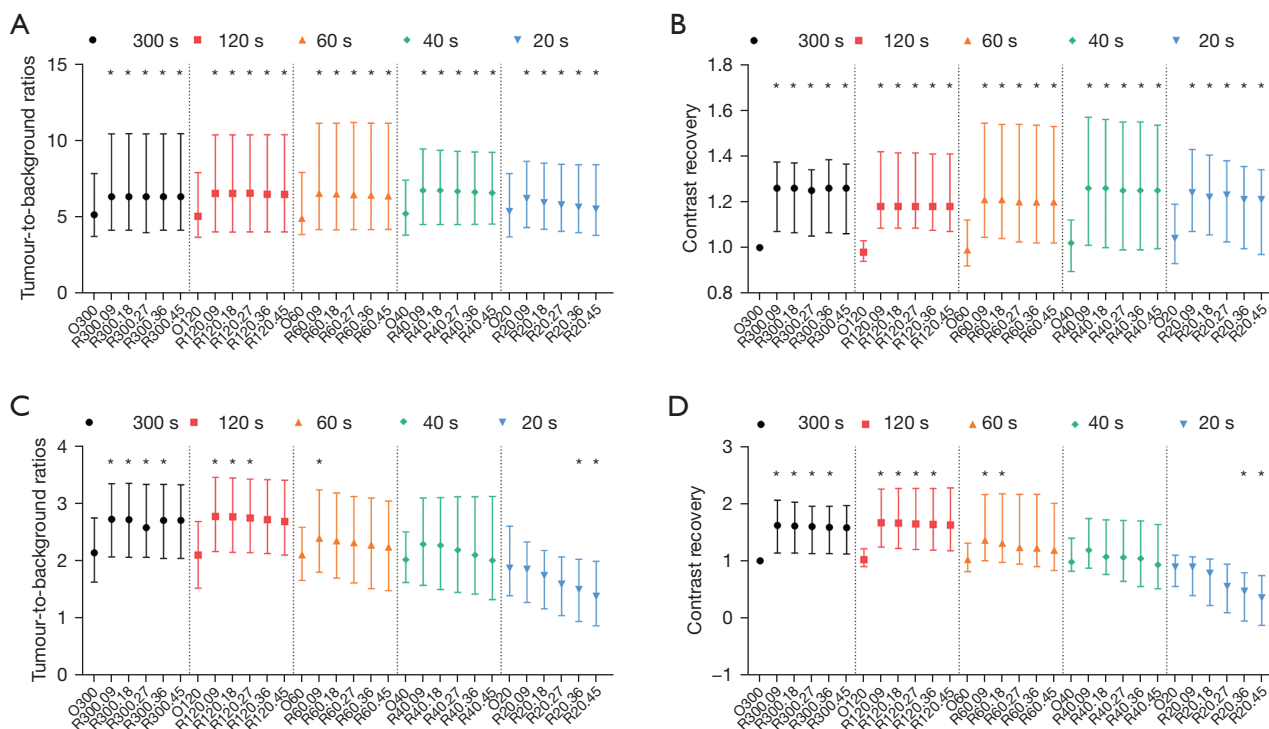


Figure 2 The normalized SUV_{max} (A) variation, the TBRs (B), and lesions contrast recovery (C). The plots show the median along with the interquartile range, and the middle point represents the median. The asterisk indicates significantly higher data ($P < 0.05$) compared to the reference O300. SUV_{max} , maximum standard uptake value; SUV_{mean} , mean standard uptake value; TBR, tumour-to-background ratios.

lesions SUV_{max} increased by 17% for R40.45, 24% for R60.36, 23% for R60.45, 28% for R120.27 and R120.36, 27% for R300.09, and 26% for R300.27 compared to O300, respectively (*Figure 2A* and *Table S2*).

The TBR values for TVREM were significantly higher than O300 (all $P < 0.05$), except for R120.45, R60.27 to R60.45, R40.27 to R40.45, and R20.18 to R20.45 (*Figure*



Note: * indicates P<0.05

Figure 3 The TBR (A,C) and CR (B,D) variation of lesions categorized by SUV_{max} ($SUV_{max} > 15$ in the first row, and $SUV_{max} < 15$ in the second row). The plots show the median along with the interquartile range, and the middle point represents the median. The asterisk indicates significantly higher data ($P < 0.05$) compared to the reference O300. TBR, tumor-to-background ratios; CR, contrast recovery; SUV_{max} , maximum standard uptake value.

2B). Besides, CR values were also significantly higher in TVREM compared to the O300 group (all $P < 0.05$), except for R120.36 to R120.45, R60.27 to R60.45, R40.18 to R40.45, and R20.09 to R20.45 (Figure 2C).

The CR and TBR for higher [^{68}Ga]Ga-PSMA-11 avidity, for which lesion SUV_{max} was ≥ 15 in O300, were significantly higher than O300 in all TVREM groups (Figure 3A,3B), whereas minor increases were observed for lesions with $SUV_{max} < 15$ (Figure 3C,3D) due to the less significant variation in TVREM groups.

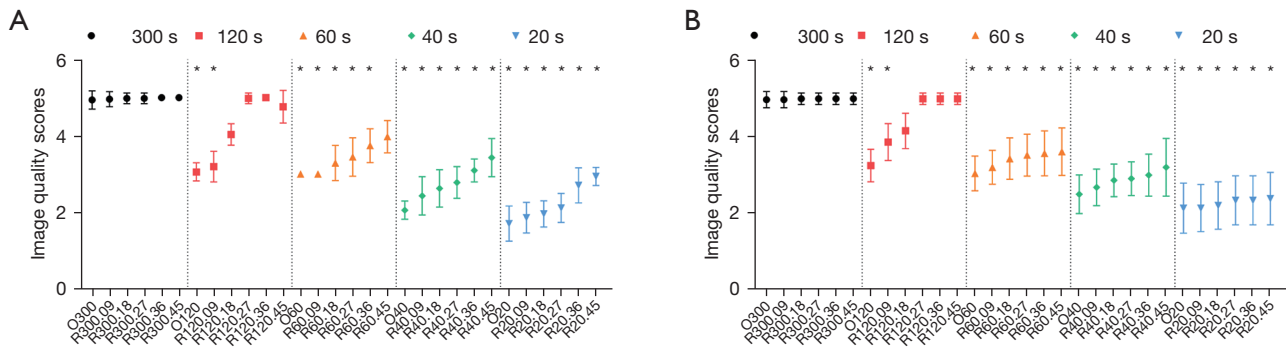
Qualitative evaluation of the image quality

The highest image quality score in terms of image noise, except for TVREM for 300 second groups, was assigned to R120.36 (5.00 ± 0.00) for 120 second groups (Figure 4A), and the highest score of lesion detectability was assigned to R120.27, R120.36, and R120.45 (4.98 ± 0.15) (Figure 4B). The image quality of the aforementioned reconstruction

groups was considered equivalent to that of O300 (all $P > 0.05$). To verify our image scoring results, we calculated the SNR and found that the highest SNR was in the R120.27 group, which increased by 41.46% compared to that of O120, and increased by 51.92% compared to that of O300 (Figures 5,6).

Phantom study

Figure S2A indicates that TVREM groups with smaller penalization factors achieved higher CRCs than OSEM and TVREM groups with larger penalization factors, and all TVREM groups outperformed OSEM under equivalent sphere diameter and acquisition time. Figure S2B shows that BVs decreased as penalization factors increased, and most TVREM groups had lower BVs than OSEM under equivalent sphere diameter and acquisition time. TVREM with acquisition times of 120 and 300 seconds had BVs comparable to O120



Note: * indicates P<0.05

Figure 4 The image quality score of image noise (A) and lesion detectability (B) in the different reconstruction groups. The mean and SD (error bar) of the image quality scores were plotted for each reconstruction group. The highest mean score that both noise and lesion detectability was given to R120.36 and all TVREM for 120 and 300 sec groups, respectively. SD, standard deviation; TVREM, total variation regularized expectation maximization.

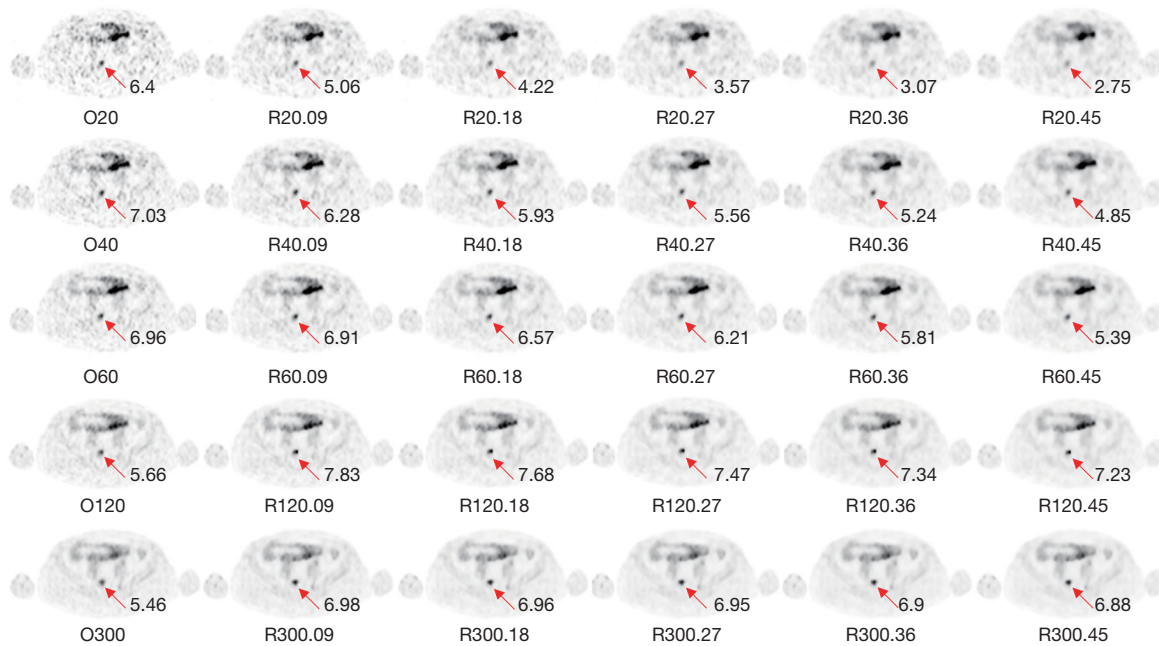


Figure 5 PET images of a 72-year-old patient with elevated PSA level (172.09 ng/mL). The images reveal a small lymph node near the iliac vessels with elevated PSMA uptake ($SUV_{max}=5.46$ in the O300 group). The lesion is well-defined in all TVREM groups. The image quality was considered suboptimal but acceptable for R120.09 to R120.18 due to the noise, adequate for R120.27 to R120.36, and good for R120.45. PET, positron emission tomography; PSA, prostate-specific antigen; PSMA, prostate-specific membrane antigen; TVREM, total variation regularized expectation maximization.

and O300, respectively, with differences ranging from 0 to 0.4%, except for R300.09 with the 10 mm diameter sphere. Furthermore, most TVREM algorithm groups demonstrated higher BVs than the O300 group, except

for the R120.09–R120.45 results for the 28 and 37 mm spheres in the TVREM algorithm group, which had similar BV performance to the O300 group (Figure S2B), with differences limited to 0–0.4%.

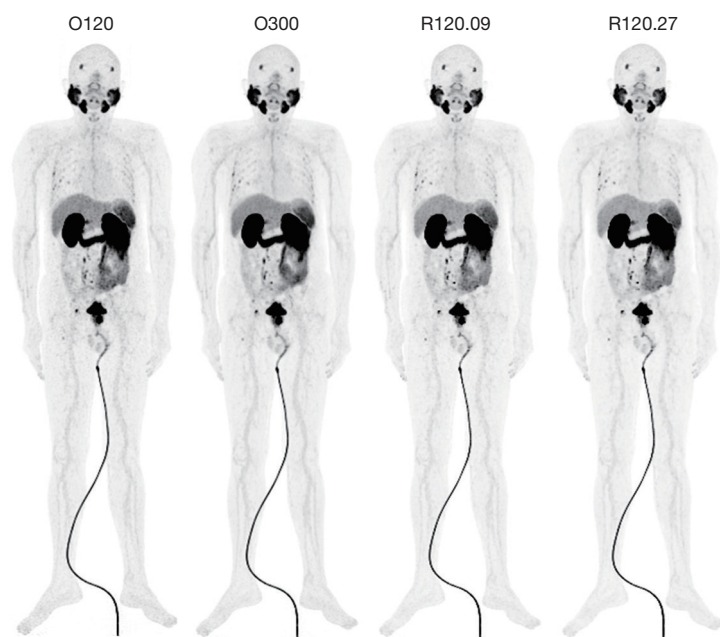


Figure 6 Maximum intensity projection of a representative 72-year-old patient. Total-body PET images with OSEM 120 and 300 sec and TVREM 120 sec with a penalization factor 0.09 and 0.27. PET, positron emission tomography; OSEM, ordered subset expectation maximization; TVREM, total variation regularized expectation maximization.

Discussion

The study has shown that the TVREM reconstruction with proper penalization factor can significantly improve the image quality over the OSEM reconstruction algorithm in [⁶⁸Ga]Ga-PSMA-11 total-body PET/CT. The TVREM 120 second group with a penalization factor in the range of 0.27 to 0.45 can achieve a 62–65% higher lesion contrast and 5–21% lower image noise compared to the OSEM 300 second group while saving 60% acquisition time. Moreover, the penalization factor between 0.27 and 0.36 in the TVREM 120 second group provided the optimal image quality for [⁶⁸Ga]Ga-PSMA-11 total-body PET with a comparable to or even lower noise level and higher contrast for lesions than in the OSEM 300 second group.

Several factors can affect the choice of the optimal penalization factor, including the setting of data collection, doctor preference, and adjustment of the reconstruction algorithm. Hence, in most cases, the optimal penalization factor is often provided as a range. TVREM has been shown in studies to maintain image quality in a relatively short acquisition time, with a penalty factor ranging from 0.14 to 0.35 (16). Yang *et al.* demonstrated that, as compared to OSEM, the TVREM algorithm can improve the contrast

of [⁶⁸Ga]Ga-PSMA-11 lesion images, decrease image noise, and obtain images at a rate of 2 min/bed while maintaining image quality during short-axis PET/CT (26). Consistent with those studies, our findings demonstrated that when the total body was obtained simultaneously, a factor within 0.27–0.45 for the TVREM 120 second group could generate higher contrast and lower noise levels compared to the OSEM 300 second group ($P < 0.05$). Moreover, the factor between 0.27 and 0.36 for TVREM had equivalent image noise to the OSEM 300 second group when the acquisition time was shortened to 120 seconds ($P > 0.05$). Therefore, the choice of optimal penalization factors may be a critical variable accompanied by the criteria for optimal image quality and acquisition settings.

A higher SUV_{max} provides a more precise and accurate quantitative evaluation, which is desired in clinical imaging. Our results indicate that parameters calculated by TVREM could more efficiently detect PCa lesions with varying [⁶⁸Ga]Ga-PSMA-11 uptake. Numerous studies have showed that BPL algorithms could enhance the lesion quantification accuracy compared to OSEM due to their full iterative convergence without over-amplified noise; however, most of those studies were about [¹⁸F]F-FDG PET/CT (20,27,28). Our study further investigated the improvement

of image quality of TVREM compared to OSEM in [^{68}Ga]Ga-PSMA-11 total-body PET/CT. The TBR increased by 24%, the CR increased by 62–65%, and the lesion SUV_{max} increased by 28% with a penalization factor between 0.27 and 0.45 in the 120 second group compared to OSEM 300 seconds, maintaining the lower image noise ranging from 5% to 21%.

In a phantom study comparing the performance of the TVREM and OSEM algorithms, our findings demonstrated that the TVREM algorithm consistently outperformed the OSEM algorithm in terms of CRC. As the penalization factor β increases, there is a gradual decrease in CRC. This suggests that within the β range used in this study, the quantification results are stable, making TVREM more robust for clinical application. Additionally, the BV results showed that the TVREM algorithm provided higher uniformity in the reconstructed background compared to the OSEM algorithm under the same conditions. The uniformity of the background in images reconstructed with the 120-second TVREM algorithm is comparable to that of the 300-second OSEM algorithm, consistent with clinical results.

The 2 experienced nuclear radiologists evaluated all reconstruction images with sufficient confidence from 2 main aspects, including noise and lesion detectability. The results showed the highest mean quality score that both noise and lesion detectability was given when the penalization factor was 0.36 for 120 second acquisition time and also contained all TVREM for 300 second groups. In addition, the image quality of that penalization factor was 0.36 for the 120 second reconstruction group, which was considered equivalent to OSEM for the 300 second group, yet it was given a significantly higher image quality score than OSEM for 120 second group, which embodied the advantages of the TVREM algorithm in visual assessment of image reconstruction. However, the weighted kappa coefficient that evaluated the assessment consistency was equal to or lesser than 0.52 (Table S3) and indicated a modest inter-rater agreement, which implied lower stability than objective indicator results.

The fixed penalization factor is necessitated in clinical practice to maintain a consistent SUV as inconsistency in SUV ascribed to variation among scanners and PET imaging methods remains challenging in both clinical routine and research studies (29-31). Moreover, according to the results of our phantom experiment, the CRC of the TVREM algorithm was generally higher than that of the OSEM algorithm. Therefore, the reconstruction conditions

such as the TVREM algorithm could more properly reflect tracer activity. To balance visual assessment and quantitative evaluation, our study suggested the optimal penalization factor of 0.27–0.36 in 120 second acquisition time, which may achieve the desirable SUV measurement and reflect the true tracer activity in tissues.

The shortening of acquisition time helps to reduce the possible patient motion artifacts, improve hospital throughput, and simplify the workflow for image reconstruction, transmission, and storage in clinical situations (32). A study on [^{18}F]F-FDG PET revealed that the BPL algorithm has potential for shortening acquisition time (33,34). In line with this study, our results indicated that TVREM saved 60% acquisition time of [^{68}Ga]Ga-PSMA-11 total-body PET/CT without compromising image quality. In addition, the superiority of total-body PET/CT systems and the advantages of the BPL algorithm in noise reduction and lesion detection enhancement might also contribute to dose reduction (26,35,36).

There were still several limitations to our study. First, the study population did not include biochemical recurrence patients with lower PSA levels; future research should be expanded to include such patients. Secondly, we did not explore whether the increased CR and TBR of the TVREM algorithm can contribute to the early detection of prostate tumors. Besides, our analysis was performed solely on [^{68}Ga]Ga-PSMA-11 total-body PET/CT; more evaluations and validations are necessary to further verify our results. Furthermore, the application of total-body PET/CT with the TVREM algorithm in human research would contribute to the investigation of multiorgan diseases, or cancer and other systemic diseases. Hopefully, the total-body PET/CT systems can become commercially available and economically reasonable, and even be supported in some basis of clinical care.

Conclusions

The TVREM reconstruction algorithm can remarkably improve lesion contrast and reduce image noise compared to OSEM in [^{68}Ga]Ga-PSMA-11 total-body PET/CT, hence enabling shorter acquisition time while maintaining a similar image quality.

Acknowledgments

The authors want to thank all the clinical and research staff at the Department of Nuclear Medicine, Renji Hospital,

Shanghai Jiao Tong University for their technical assistance and helpful discussions.

Funding: This work was supported in part by the National Key Research and Development Program of China (Grant Nos. 2020YFA0909000 and 2021YFA0910000), the National Natural Science Foundation of China (Grant Nos. 82001878 and 82171972), and the Shanghai Rising-Star Program (Grant No. 20QA1406100).

Footnote

Conflicts of Interest: All authors have completed the ICMJE uniform disclosure form (available at <https://qims.amegroups.com/article/view/10.21037/qims-22-1341/coif>). XY, DH, HS, QG, YLN, and YZ are employees of United Imaging Healthcare Group Co., Ltd. The other 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. The study was conducted in accordance with the Declaration of Helsinki (as revised in 2013). The study was approved by the Ethics Board of Renji Hospital, School of Medicine, Shanghai Jiao Tong University and informed consent was provided by all the patients.

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Cite this article as: Li L, Chen R, Wen J, Yang X, Hu D, Sun H, Ge Q, Ng YL, Zhou Y, Wan L, Chen Y, Wei W, Liu J. Improved [⁶⁸Ga]Ga-PSMA-11 image qualities reconstructed by total variation regularized expectation maximization on total-body PET/CT. *Quant Imaging Med Surg* 2023;13(8):5230-5241. doi: 10.21037/qims-22-1341