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Programa de Doctorado de Física Nuclear

Defensa de Tesis Doctoral

SIMULATION AND IMAGE RECONSTRUCTION OF CLINICAL TOF-PET SCANNERS

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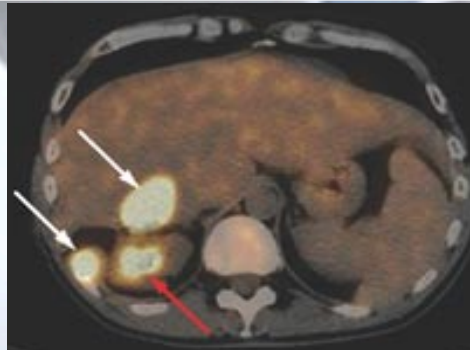
1. Introduction and Objectives
2. Simulation of clinical PET scanners
3. I m a g e reconstruction
4. Conclusions

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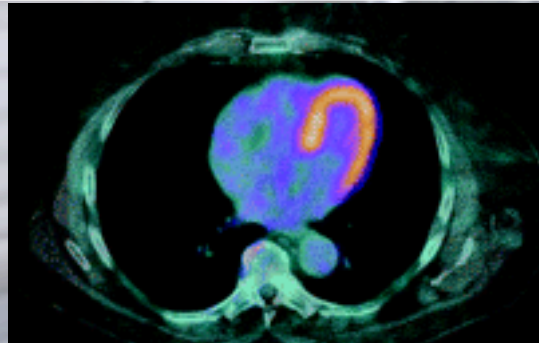
- 1. Introduction and Objectives**
2. Simulation of clinical PET scanners
3. Image reconstruction
4. General Conclusions

Positron Emission Tomography (PET)

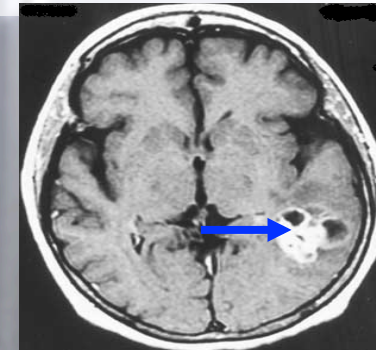
- ▶ PET is a nuclear medicine imaging technique that produces a 3D image of functional processes in the body.
- ▶ It is a key diagnostic imaging modality used largely in determining the presence and severity of cancers, neurological conditions, and cardiovascular diseases.



Fenske et al., (2008) *Nat Clin Prac Oncol* 5, 677-681



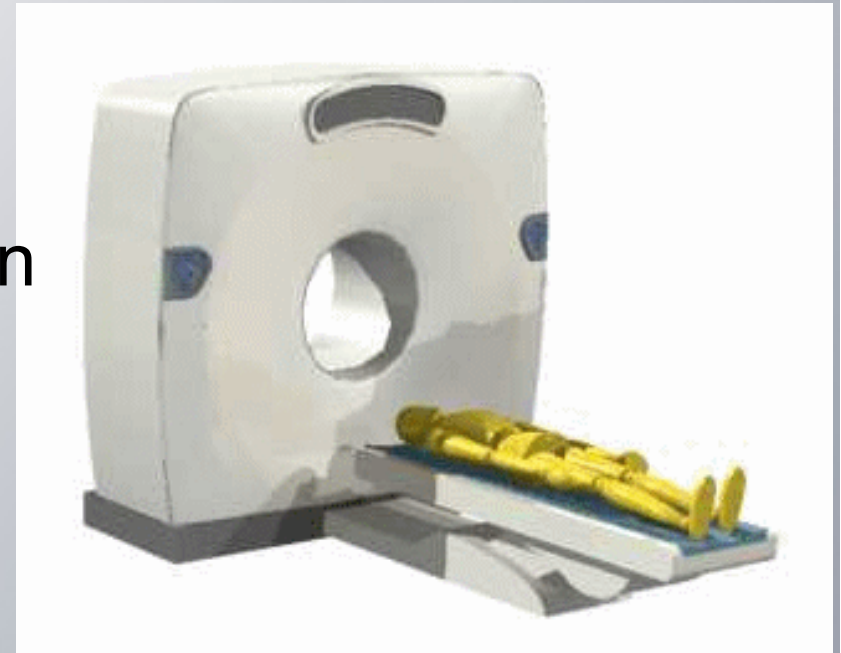
Gould et al., (2007) *J Nucl Med* 48, 1112-1121



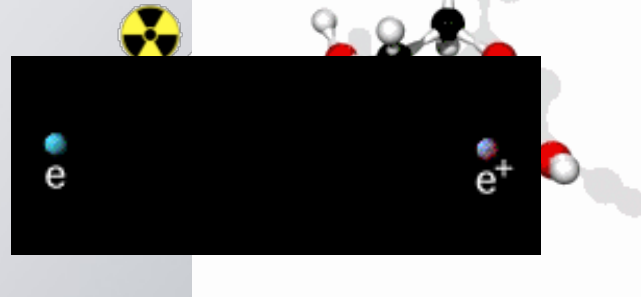
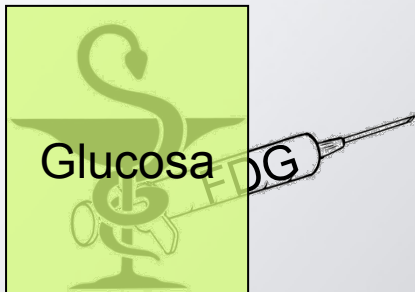
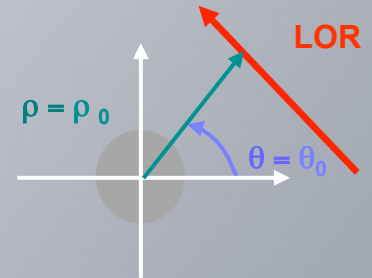
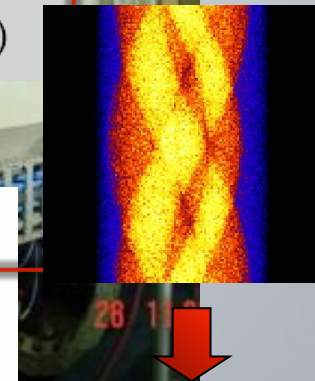
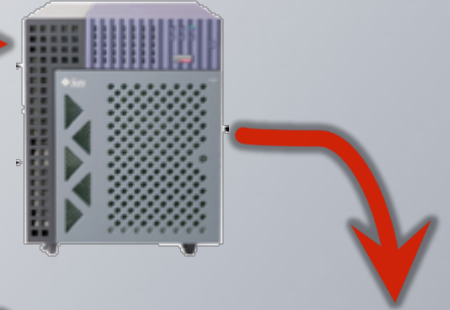
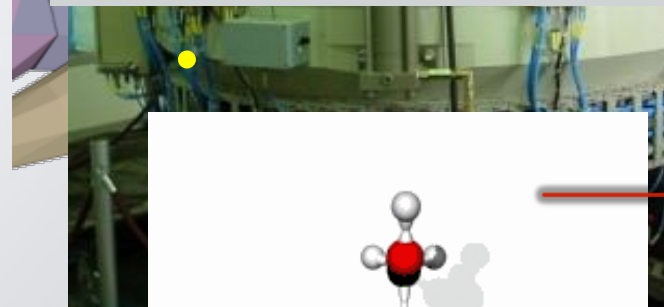
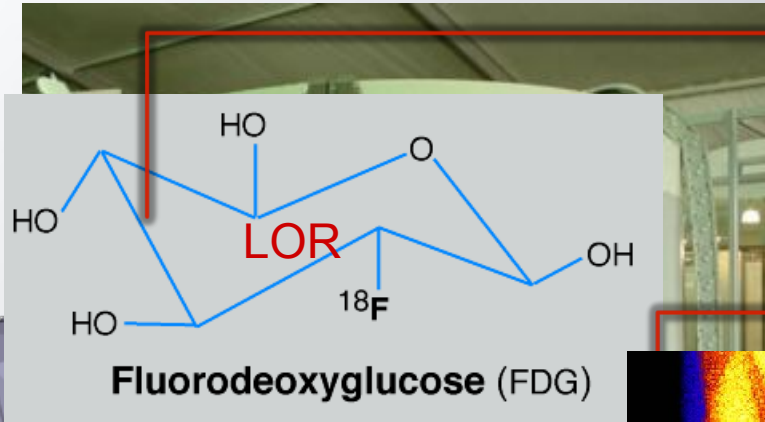
Hicks et al., (2012) *Nat Rev Clin Oncol* 9, 712-720

PET Scanners

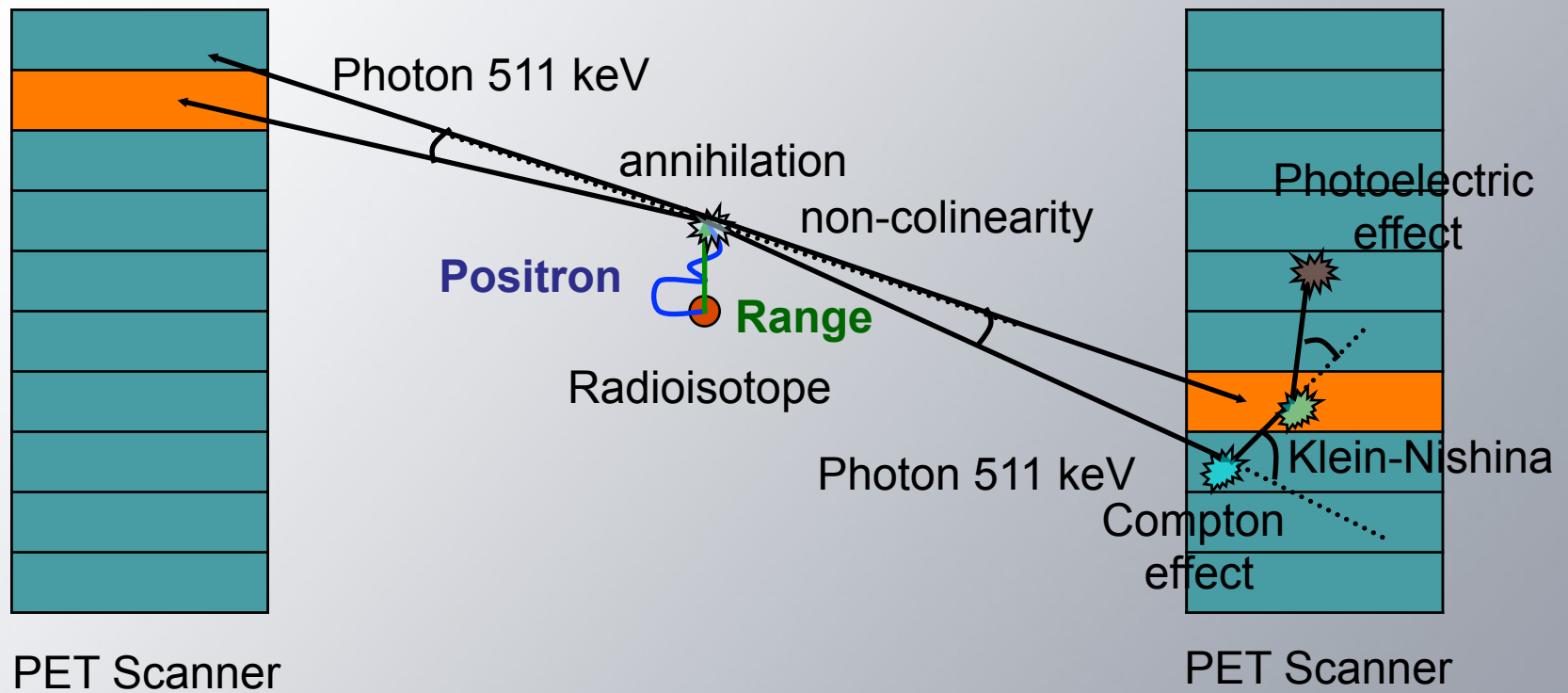
- ▶ **Scanner** - to perform the clinical exam
 - ▶ Includes a computer running algorithms for tomographic reconstruction & display
- ▶ **Cyclotron** - to produce the positron-emitter (radionuclide)
- ▶ **Radiopharmacy** - to produce the labeled molecule



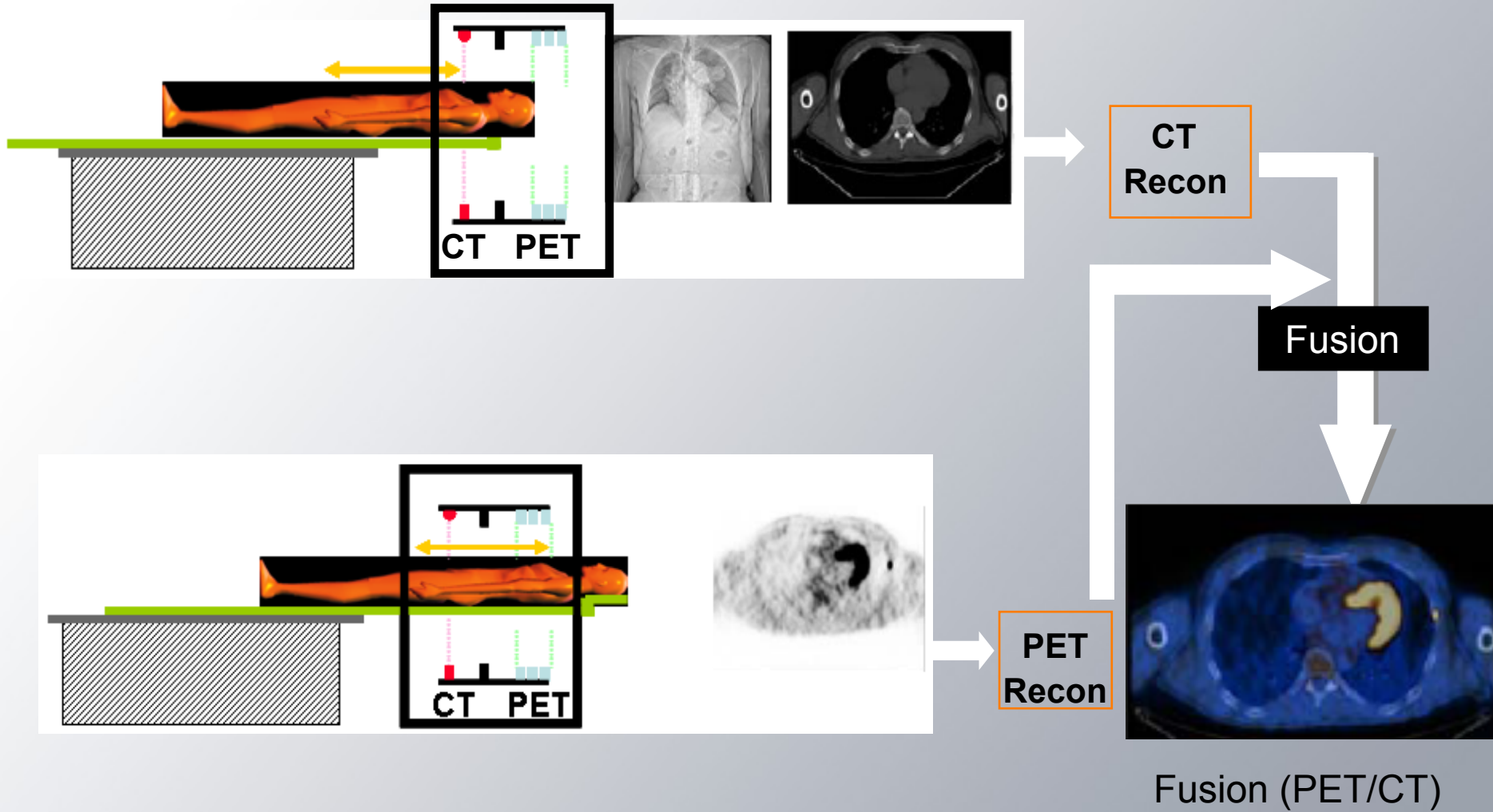
PET Procedure



Physics of PET



PET/CT scan protocol



Challenges for next generation PET scanners

Developments in PET technology aim to provide:

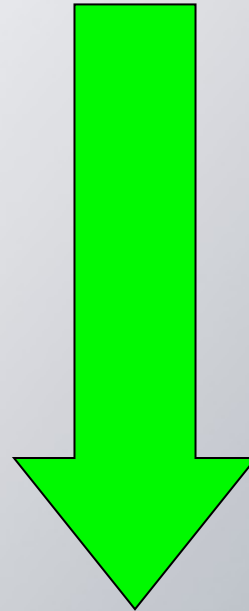
- ▶ **Better images** (more accurate information of the distribution of the radiotracer in the body)
- ▶ In **shorter** scanning and reconstruction **time**
- ▶ leaving **lower radiation dose** in the patient
- ▶ Using more **affordable** scanners

Improving one aspect may worsen some other

In order to improve current PET scanners, it is necessary to be able to evaluate precisely the impact of new technology in all these different aspects.

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**Simulation of clinical
PET scanners**



**Image
reconstruction**

Monte Carlo simulation in PET

- *Methods in which all processes related to the experimental system under study are modelled in a computer.*
- *The name Monte Carlo (MC) is used because often random numbers processes are employed to generate simulated events.*
 - ▶ Because nuclear medicine imaging deals with the emission of radiation energy, MC simulations of radiation emission and detection are an important tool for research and development of PET scanners.
 - ▶ MC simulations are widely used for PET aiming to take into account all the processes involved in PET imaging.
 - ▶ MC simulations have been proven to be a useful tool to study performance characteristics and parameters that cannot be measured experimentally.

Monte Carlo simulation in PET

■ *Applications:*

- ▶ Scanners design
- ▶ Data Processing
- ▶ Data Correction
- ▶ Image Reconstruction

■ *Some existing codes:*

- ▶ SimSET [Harrison et al., 1993]
- ▶ GATE [Jan et al., 2004] (GEANT4)
- ▶ Eidolon [Zaidi and Scheurer, 1999] (MCNP)
- ▶ PETSIM [Thompson et al., 1992]
- ▶ GAMOS [Arce et al., 2008] (GEANT4)
- ▶ PeneloPET [España et al., 2009] (PENELOPE)



PeneloPET

- *PeneloPET* [1], is a Monte Carlo simulator for PET scanner based on PENELOPE [2].

- *PENELOPE*
 - ▶ Penelope is a code for the Monte Carlo simulation, it describes the transport and the interaction of *electrons*, *gammas* and *positrons*, in matter.
 - ▶ Energies range from a few hundred eV to 1 GeV (suits well PET needs).
 - ▶ Robust, fast and accurate (used in dosimetry and radiotherapy).

[1] S España et al (2009) *Phys Med Biol*, 54, 1723-1742

[2] Salvat et al (2008) PENELOPE-2008: A code system for Monte Carlo simulation of electron and photon transport.

Objectives

The main objective of this thesis is to extend the capabilities of the tools developed in our group (GFN) for PET imaging, so far intended for the **preclinical** arena, to **clinical** settings, and to validate these tools against clinical measurements

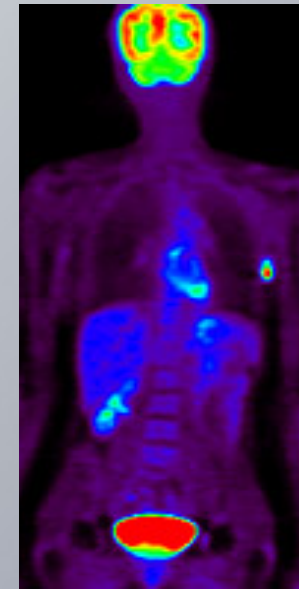
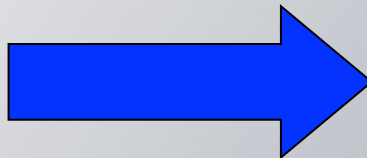
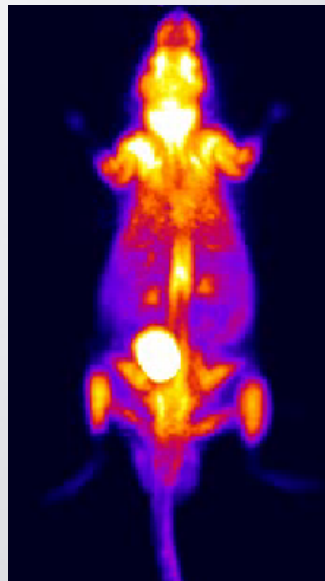


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Simulation of clinical PET scanners



Image
reconstruction

Characterizations of clinical scanners

Three Biograph PET Scanners

- ▶ Biograph TruePoint (*B-TP*)
- ▶ Biograph TruePoint with TrueV (*B-TPTV*)
- ▶ Biograph mCT PET/CT (*mCT*)



B-TPTV

Siemens Data sheet

Scanner	B-TPTV	mCT	B-TP
Number of block rings	4	4	3
Block detector per ring	48	48	48
Detector elements dimension	4x4x20 mm	4x4x20 mm	4x4x20 mm
Axial FOV	218 mm	218 mm	162 mm
Transaxial FOV	680 mm	700 mm	680 mm
Number of image planes	109	109	81
Coincidence time window	4.5 ns	4.1 ns	4.5 ns
Energy window	425-650 KeV	435-650 KeV	425-650 KeV
Energy resolution	11.7%	11.7%	11.7%
Pitch size	4 mm	4 mm	4 mm
Reflector thickness (estimated)	0.4 mm	0.4 mm	0.4 mm
Crystal length (thickness)	20 mm	20 mm	20 mm
Detector ring diameter	856 mm	856 mm	856 mm
CFOV -C. front of detector	42.80 cm	42.80 cm	42.80 cm
Maximum ring difference	38	49	27

■ *Unknown Information*

- ▶ Some minor details of the geometry of the scanner.
- ▶ Materials (bed, shielding and covers).
- ▶ Detailed behavior of the acquisition electronics.

■ *How to deal with the unknown*

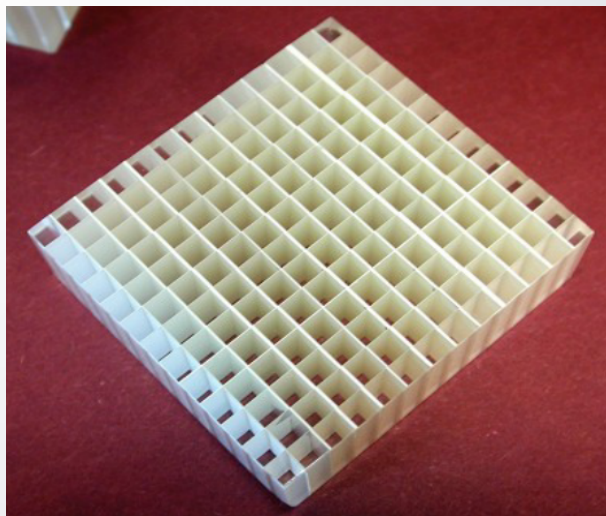
- ▶ ***B-TPTV*** has been taken as a reference to tune some of the parameters of the simulations.
- ▶ Published experimental values of the B-TPTV have been used as reference (sensitivity, NEC, spatial resolution and TOF).

Simulation parameter	Measured properties
Reflector thickness	Sensitivity (B-TPTV)
Singles, coincidences dead time and integration time	NEC curve, randoms and trues (B-TPTV) rate curves
Time jitter	TOF, FWHM (B-TPTV)

Sensitivity

- The sensitivity of a PET scanner quantifies the ability of a scanner to detect the coincident photons emitted from inside the FOV.

■ Reflector thickness?



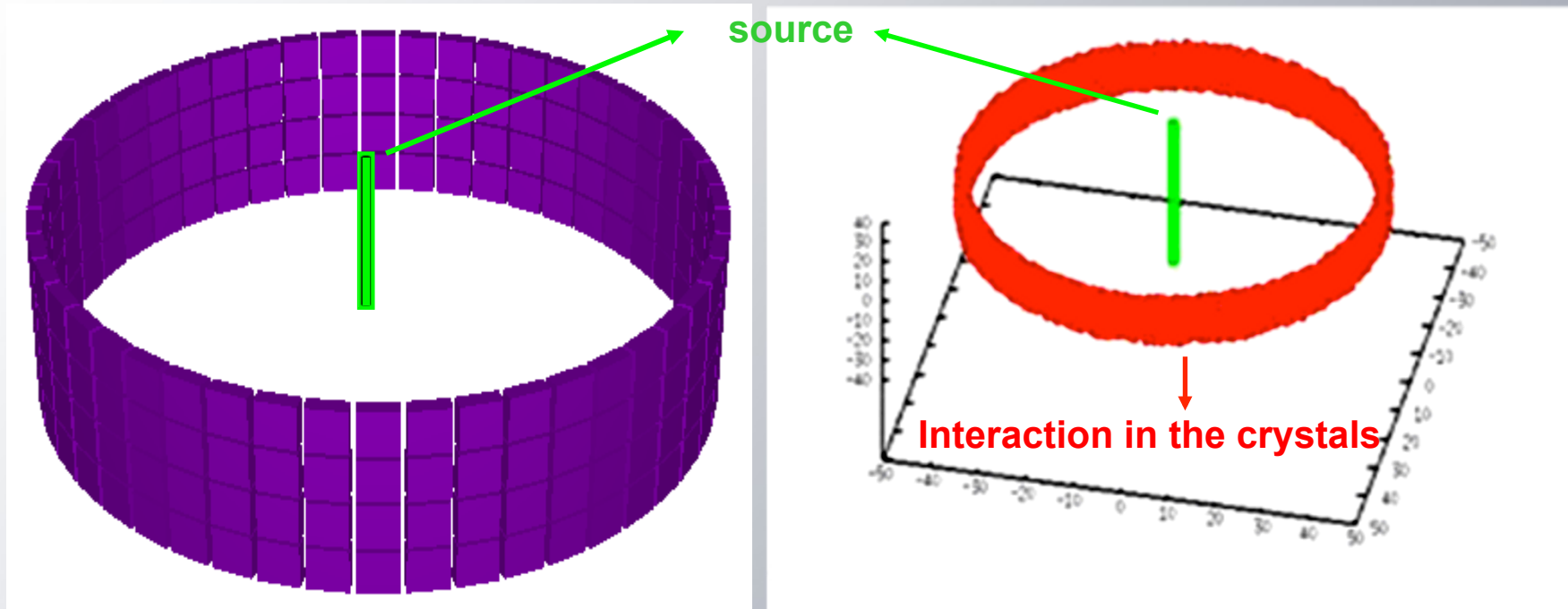
Detector elements/block
(4×4×20mm³)

■ Parameters employed

Scanner	B-TPTV	mCT	B-TP
Detector ring diameter (mm)	856	856	856
Axial FOV (mm)	218	218	162
Coincidence time window (ns)	4.5	4.1	4.5
Energy window (keV)	425-650	435-650	425-650

Sensitivity

- **NEMA [3] protocol**
 - ▶ A line source (70 cm), low activity (3.9 MBq).
 - ▶ Dead time loss <1% and random <5%.
 - ▶ Sensitivity at 2 transaxial position (0 and 10 cm) was obtained.



Sensitivity

Energy window $>(425-650 \text{ KeV})$, Time window $>(4.5 \text{ ns})$

Sensitivity [kcps/MBq] @ 0 and 10 cm off center

<i>Scanner</i>	<i>Simulated (this work)</i>	<i>Simulated (GATE) [4]</i>	<i>Experimental [5], [6]</i>
<i>B-TP</i>	4.6	4.8	4.5
<i>B-TPTV</i>	w/o reflector 9.2 with reflector 8.2	8.7	8.2
<i>mCT</i>	9.8	-	9.7

- ▶ The use of a reflector thickness of the order of 0.4 mm yields good agreement with the measured sensitivity.
- ▶ This reflector thickness was employed in all simulations in this work.

[4] Eriksson et al., (2007) *Nuc Inst and Meth in Phy Res Sec A* 580, 836–842

[5] Jacoby et al., (2009) *Trans Nucl Sci* 56, 633–639.

[6] Jacoby et al., (2011) *Phy Med Biol* 56, 2375–2389

Scatter fraction (SF)

- ▶ The proportion of accepted coincidences which have undergone Compton scattering prior to detection is called *scatter fraction (SF)*.
- ▶ The SF is a critical component of the NEC rate computation, and in our work it is a genuine prediction of the simulations, no parameters have been fitted to reproduce it.
- ▶ The SF was measured from low activity simulations, where random counts are negligible .
- ▶ Its used as a golden measure to optimize timing and energy windows.

$$SF = \frac{S}{T+S}$$

Scatter fraction (SF)

<i>Number of block rings</i>	<i>Scatter fraction (%)</i>		
	<i>Simulated (this work)</i>	<i>Simulated (GATE)</i>	<i>Experimental</i>
<i>B-TP</i>	34.3	33	32.0
<i>B-TPTV</i>	31.3	35	32.5
<i>mCT</i>	34.8	-	33.5

- ▶ Simulated and experimental values of SF are within 4%.
- ▶ It remains fairly constant for all the scanners simulated.

Noise equivalent count (NEC) rate

- ▶ NEC is a global measure, taking into account scatter and random coincidences, of the scanner ability to acquire useful counts.
- ▶ It describes the effective number of counts measured by PET scanner as a function of activity in the FOV.

$$NEC = \frac{T^2}{T + S + R}$$

T > True coincidence count rate

S > Scatter coincidence

R > Random coincidence

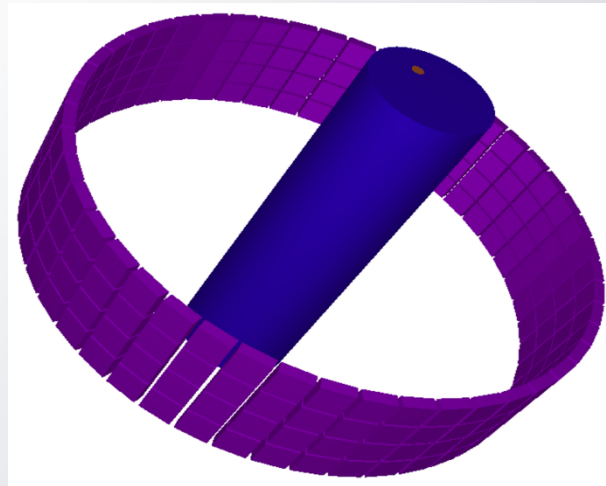
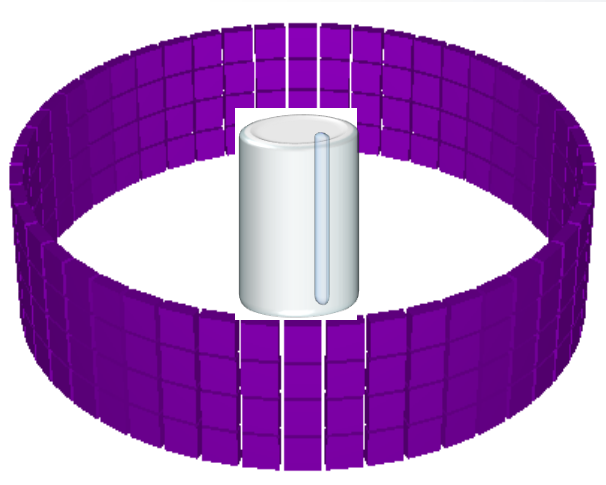
Noise equivalent count (NEC) rate

■ *NEMA protocol*

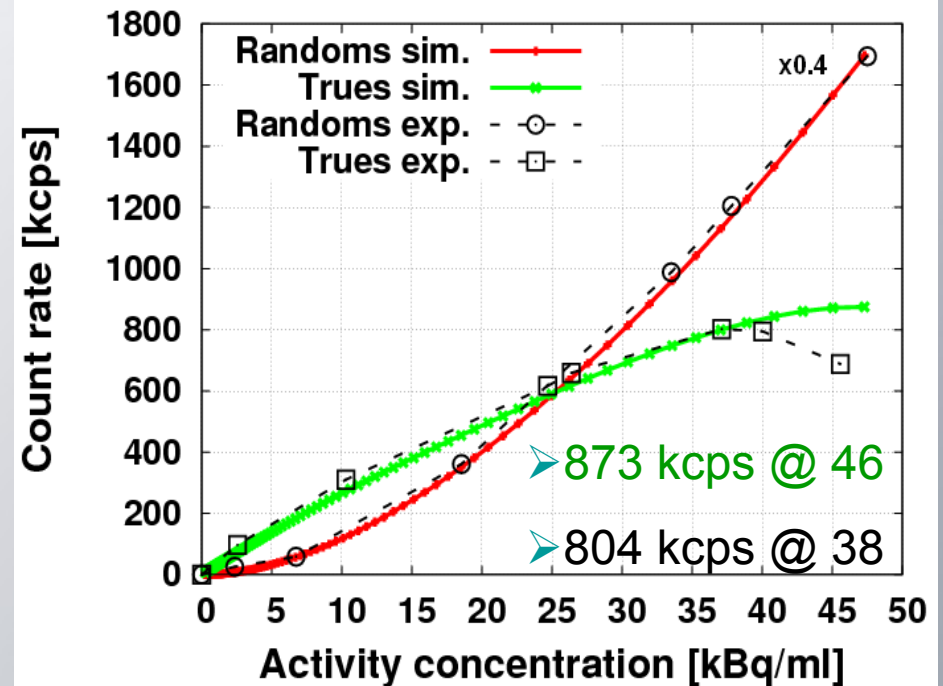
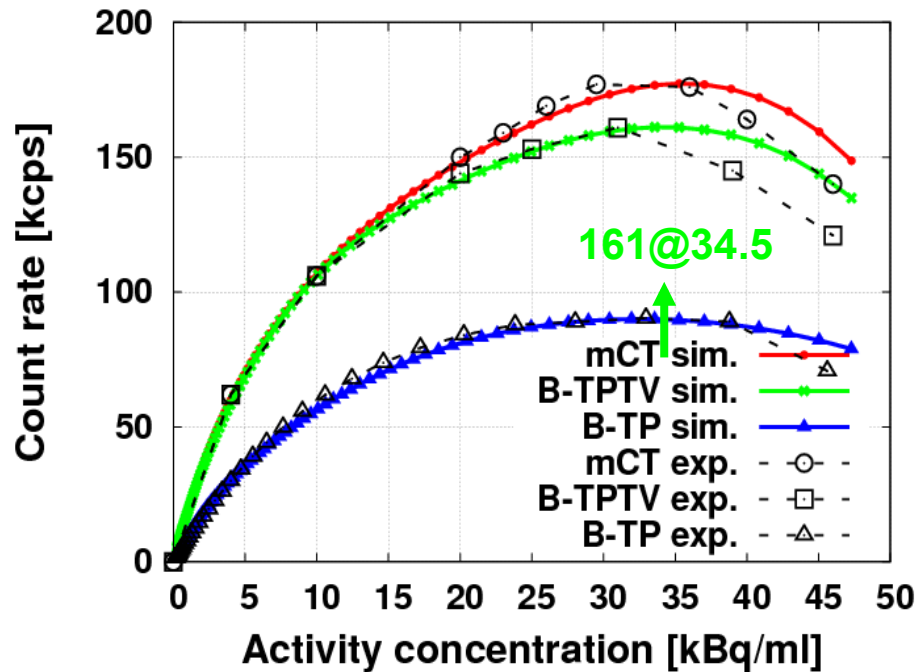
- ▶ Initial activity (1.04 GBq ^{18}F).
- ▶ Data simulated for 35 frames.
- ▶ NEC plotted as a function of activity.

■ *PeneloPET includes simulation of acquisition electronics*

- ▶ *Singles dead time* > applied to every photon that reaches the scanner.
- ▶ *Coincidence dead time* > further dead time involved in the processing of events identified as coincidences.
- ▶ *Integration time* > pile-up (and pile-up rejection) effects.



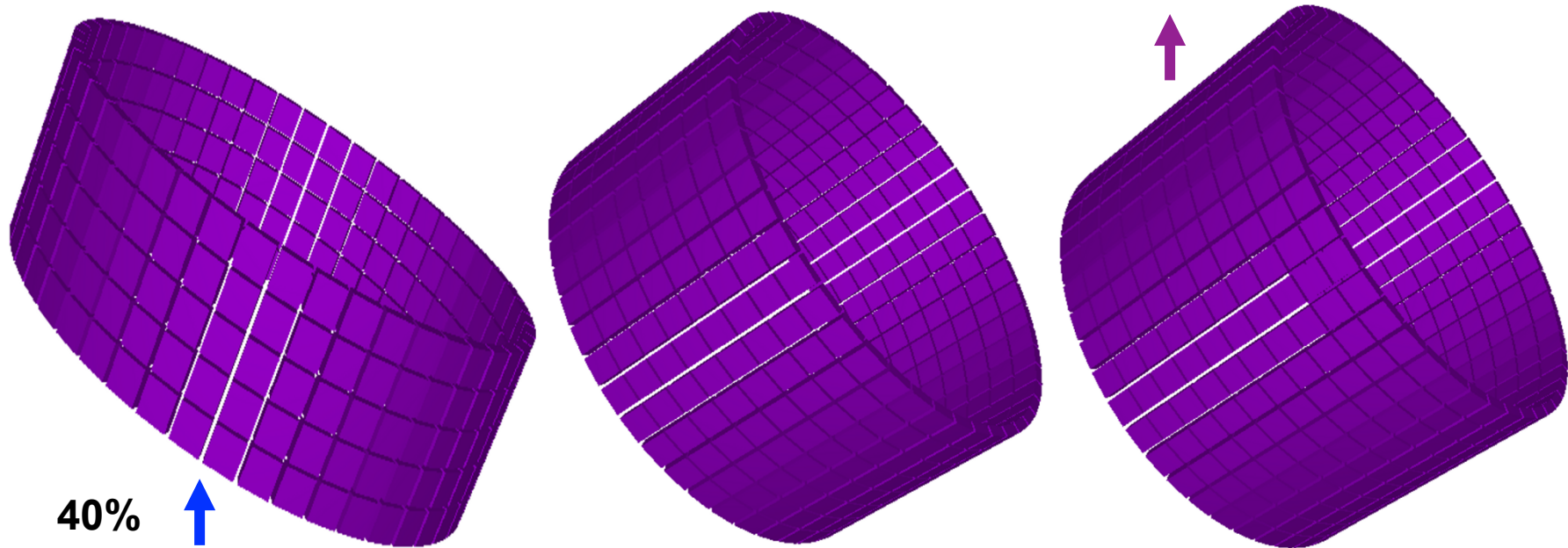
Noise equivalent count (NEC) rate



Scanner	NEC Peak (Kcps) @(kBq/ml)		
	Simulated (this work)	Simulated (GATE)	Experimental
B-TP	90 @ 34	100@34	93@34
B-TPTV	161@34.5	177@34	161@31.5
mCT	177@35.5	-	180.3@29

Sensitivity (extended rings)

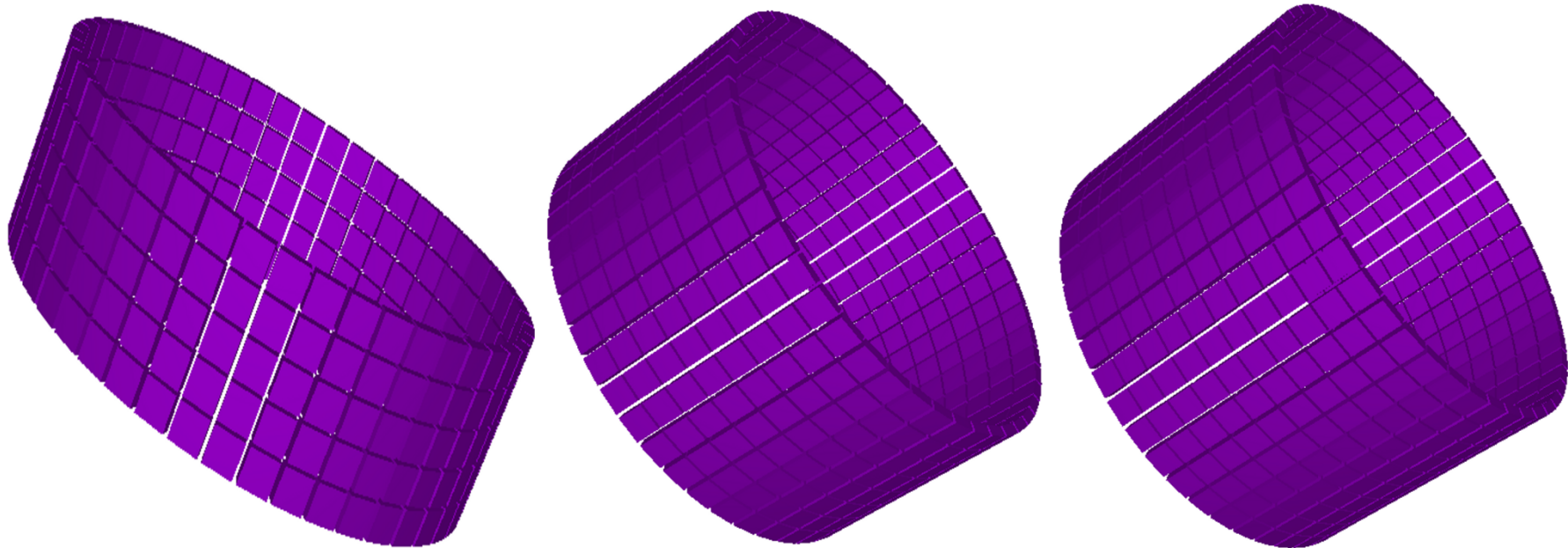
► sensitivity increased 6 times > BTPTV



Sensitivity [kcps/MBq] @ 0 and 10 cm off center

<i>Number of block rings</i>	<i>Axial FOV (cm)</i>	<i>Simulated (this work)</i>	<i>Simulated (GATE)</i>	<i>Maximum ring difference</i>
<i>5-rings</i>	<i>27.2</i>	<i>12.5</i>	<i>-</i>	<i>38</i>
<i>8-rings</i>	<i>43.6</i>	<i>31.7</i>		<i>38</i>
<i>10-rings</i>	<i>54.5</i>	<i>48.7</i>	<i>47.8</i>	<i>38</i>

NEC (extended rings)

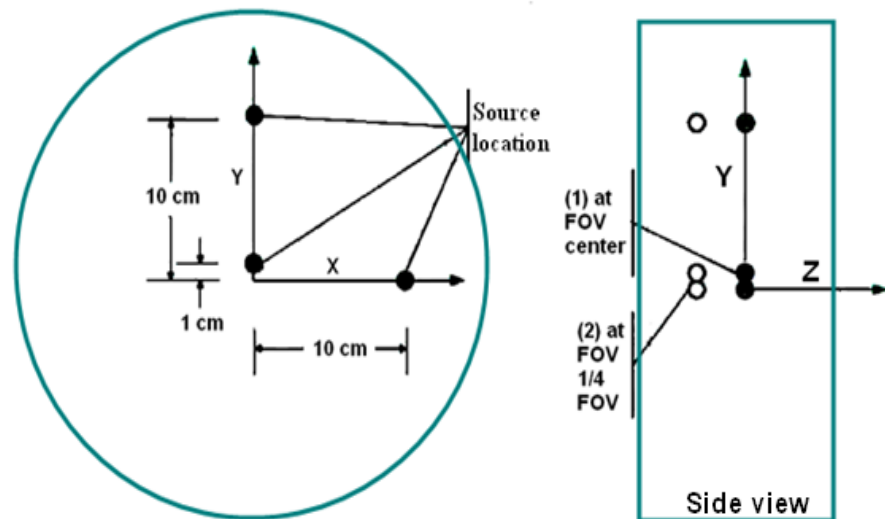


Number of block rings	NEC Peak (Kcps) @ (kBq/ml)		Scatter fraction (%)	
	Simulated (this work)	Simulated (GATE)	Simulated (this work)	Simulated (GATE)
5-rings	259@36	-	30.8	-
8-rings	489@35	-	32.0	-
10-rings	787@30	800@31	33.1	35

Spatial resolution

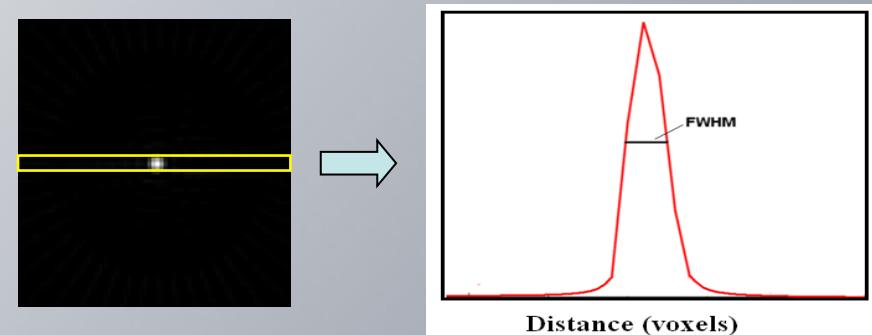
- The spatial resolution of a PET scanner represents its ability to disentangle two close point sources.

- **NEMA protocol**



- **Acquisition methods**

- ▶ Filtered back projection reconstruction of sinogram data into images with $336 \times 336 \times 109$ voxels (voxel size of 2 mm)



Spatial resolution

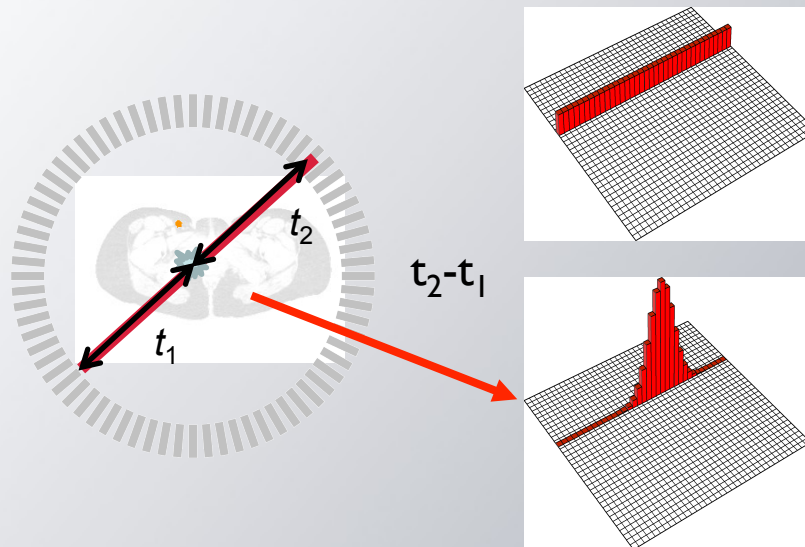
	<i>FWHM (mm)</i>		<i>FWTM (mm)</i>	
	<i>Simulated</i>	<i>Experiment</i>	<i>Simulated</i>	<i>Experiment</i>
	<u><i>1 cm off center</i></u>			
<i>Transverse</i>	4.6	4.2	8.5	8.1
<i>Axial</i>	4.2	4.5	8.4	9.2
<i>Average resolution</i>	4.4	→ 4.4		
	<u><i>10 cm off center</i></u>			
<i>transverse radial</i>	5.5	4.6	9.0	9.4
<i>Transverse tangential</i>	5.6	5.0	10.2	9.4
<i>Axial</i>	4.4	5.5	7.5	10.5
<i>Average resolution</i>	5.3	→ 5.0		

- ▶ The experimental reconstructed image size was 336 x 336 x 109 with a voxel size of 2 mm

Time of flight (TOF) PET scanners

■ principle of operation

- ▶ TOF-PET systems exploit the time difference between the two emitted photons to improve the location of the annihilation position along LOR.
- ▶ The measured time difference is used by the reconstruction algorithm to locate the annihilation point $\Delta\mathbf{x}$ inside the LOR ($\Delta\mathbf{x} = c \Delta t/2$).



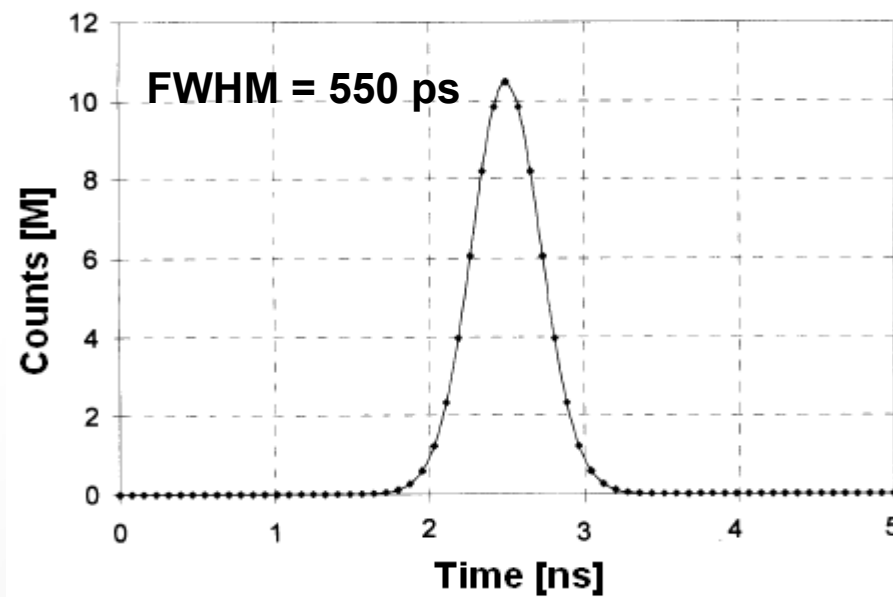
PET traditional

The probability for the event to be located along the LOR is uniform

PET Time-of-Flight

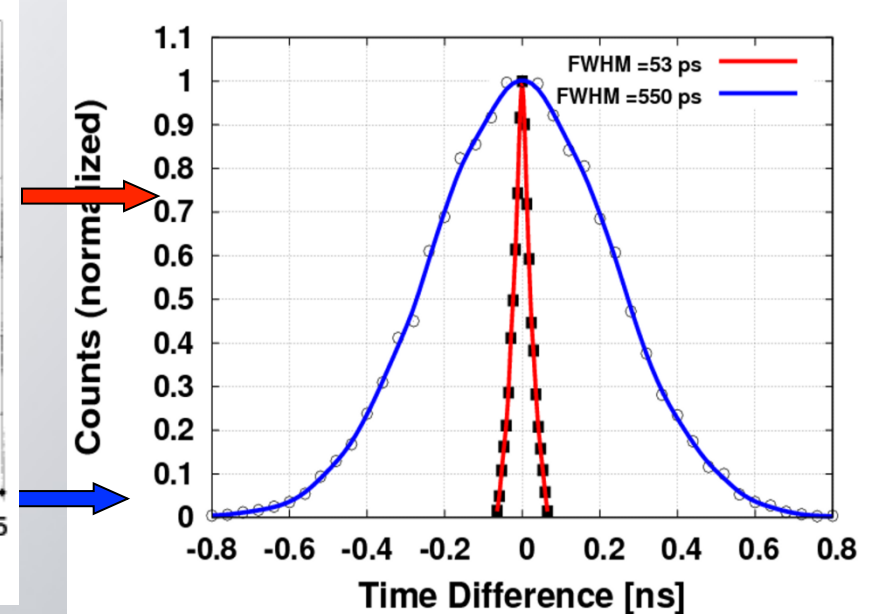
The most likely position has to be compatible with the measured TOF value

TOF has been incorporated in PeneloPET



Measured time distribution [7]

- ▶ An additional time jitter of 170 ps is introduced in the simulations to produce a TOF resolution of 550 ps (FWHM) for the B-TPTV scanner.



- ▶ Simulated TOF distribution from a centered source.

Conclusion

- ▶ PeneloPET is flexible enough to easily accommodate different parameters in the simulations.
- ▶ Good agreement between simulations and experiment can be obtained.
- ▶ PeneloPET is suitable for simulating and investigating clinical systems.

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Simulation of clinical
PET scanners



**Image
reconstruction**

Analytical and iterative methods

- ▶ ***The basic role of image reconstruction is to convert the measured counts at projections with many different angles around the object, into an image that reflects in a quantitative way the distribution of positron-emitting atoms.***
- ▶ ***There are two main approaches to image reconstruction.***

Analytical and iterative methods

Analytical method
(FBP)

Based on the formalism of computed tomography that relates line integral measurements to the activity distribution in the object. It does not model the physics in detail.

Iterative method

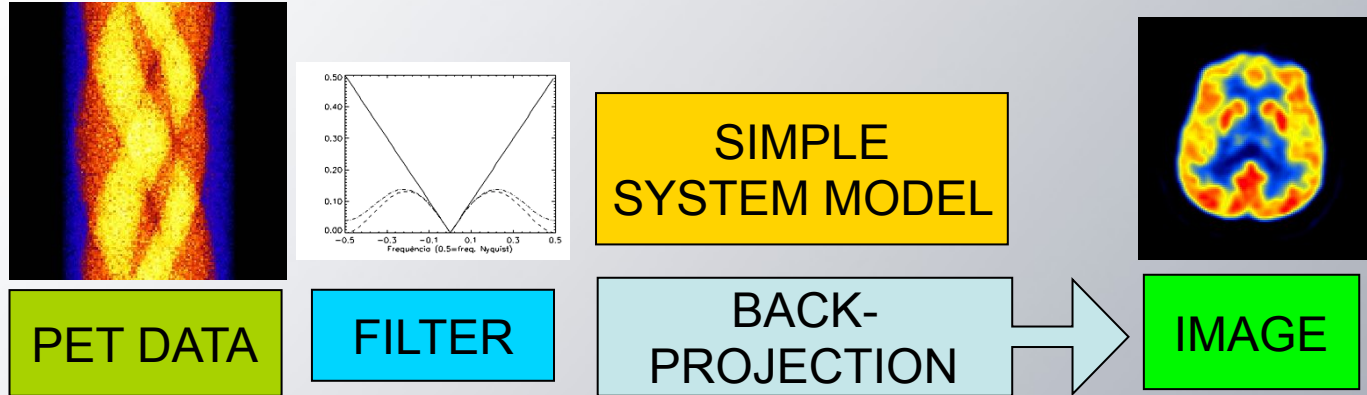
**Based on
statistical
methods**

**Require a
system model**

The data collection process in a PET scanner is modeled in some detail. In a series of successive iterations, the image that is most consistent with the measured data is obtained.

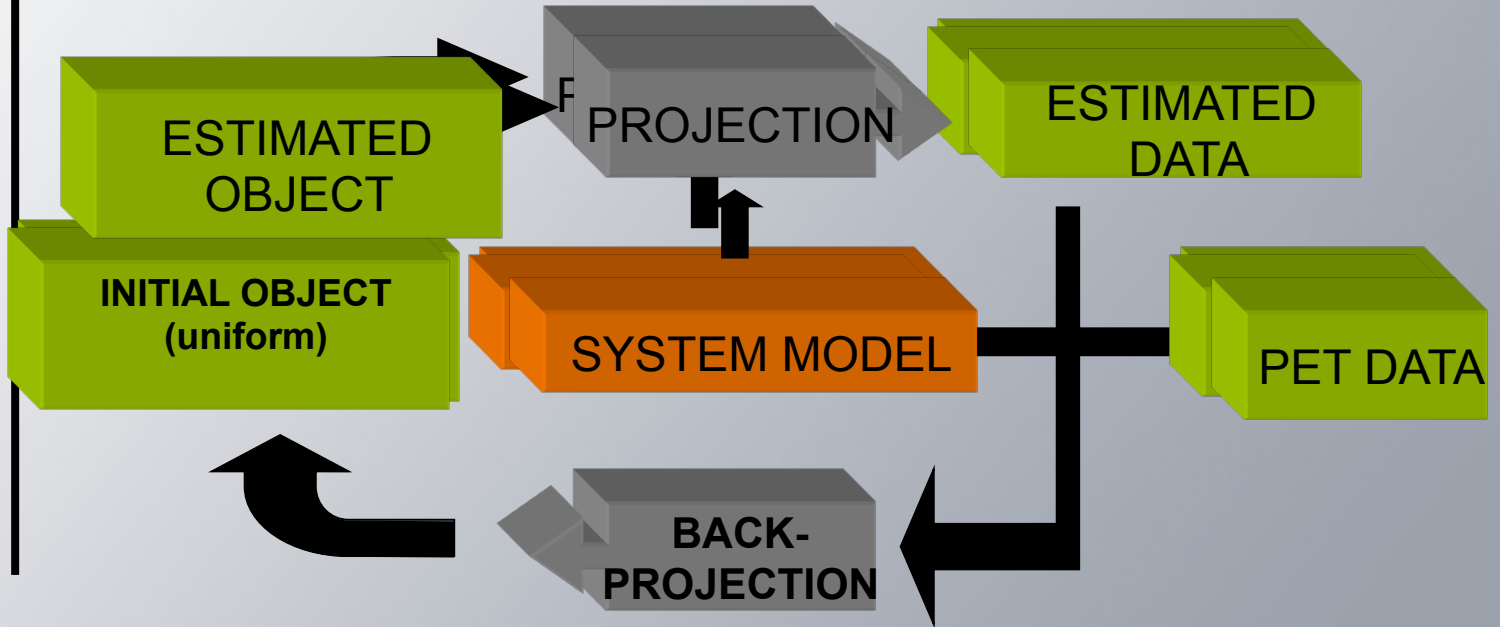
Analytical and iterative methods

Analytical method (FBP)



Iterative method

Based on statistical methods
Requires a system model



GFIRST-GPU

- ▶ GFIRST is an implementation of FIRST (*Fast Iterative Reconstruction Software for (PET) tomography*) code [8] developed by our group.
- ▶ It is implemented in CUDA (Computer Unified Device Architecture).
- ▶ GFIRST was designed to work with sinograms.
- ▶ ***This part of the thesis aims to demonstrate that GFIRST can incorporate TOF information, and to investigate with the help of realistic simulations the gain in image quality that can be achieved using TOF in different situations.***

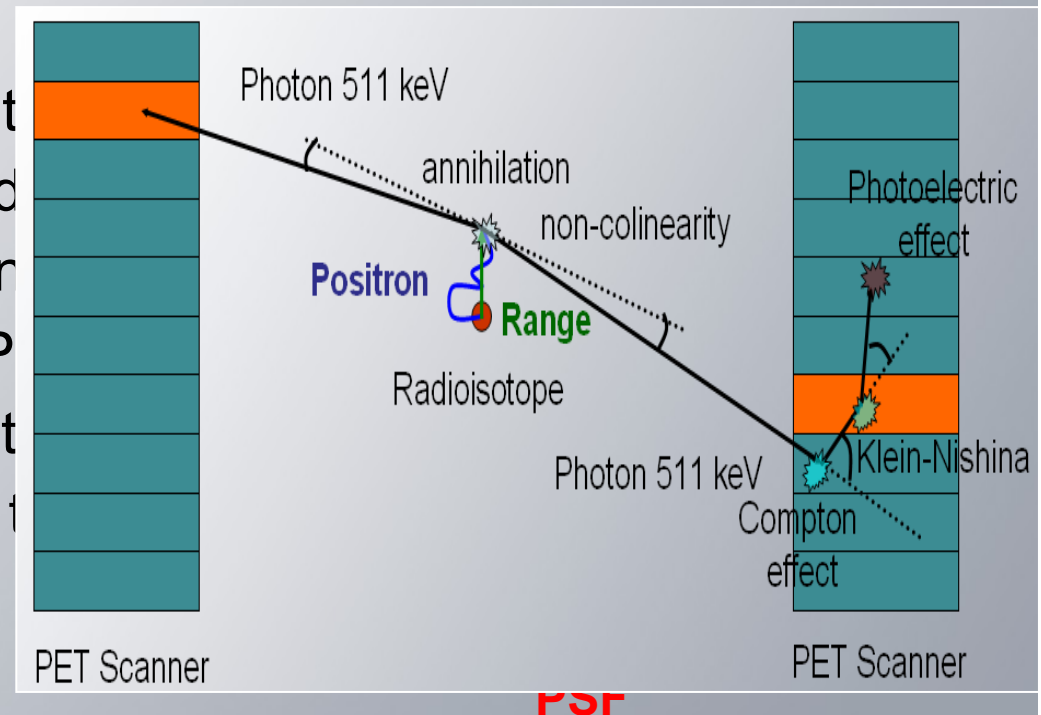
[8] Herraiz et al., 2006 *Phys Med Biol*, 51, 4547–4565

GFIRST Improvements

■ Point Spread Function (PSF)

- ▶ Blurring effects in PET such as positron-range, non-collinearity of the gamma rays, limit the maximum resolution achievable in reconstructed PET images.

- ▶ In order to improve the reconstruction method and increase the convergence rate of the algorithm, a PSF was used to model the physics blurring effects in the reconstruction.

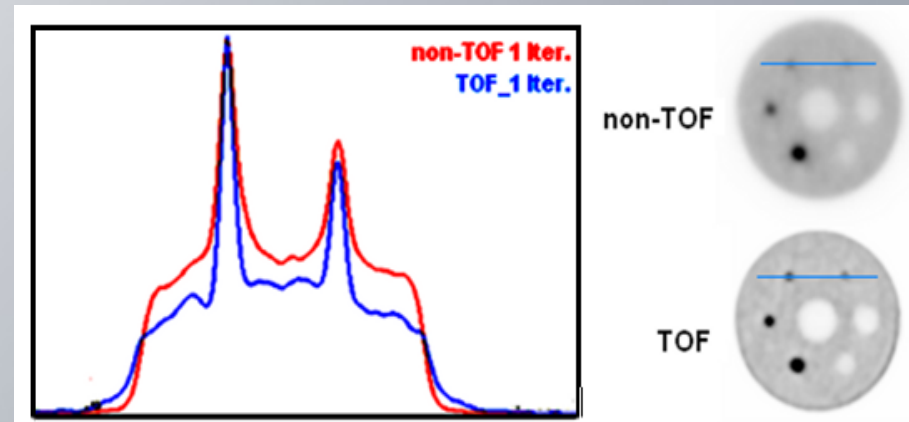


GFIRST Improvements

■ Median filter and TOF

- ▶ We extended GFIRST to include median filter regularization.
- ▶ In this case, after every iteration, the image is smoothed by applying a penalty to those voxels which deviate significantly from their neighbours.

- GFIRST was extended to incorporate TOF information. GFIRST was initially developed for non-TOF sinogram reconstructions.



Effect of TOF in image quality

■ *Methods and materials*

✓ *PET scanner*

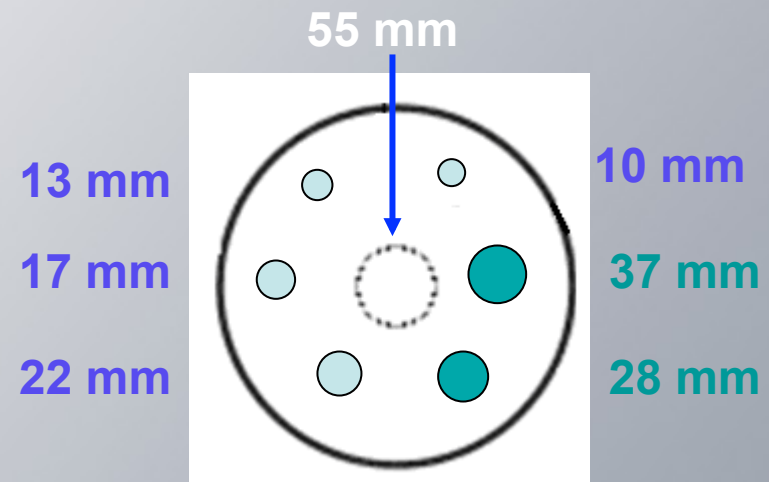
- ▶ The scanner employed for the simulation was the B-TPTV PET/CT. The TOF resolution of this system is 550 ps.

✓ *Image quality phantom*

- ▶ The NEMA image quality phantom was used.

✓ *Sinograms*

- ▶ In PeneloPET, sinograms corresponding to different combinations of rings in which each of the gamma ray has been detected are grouped together using *Michelograms*.

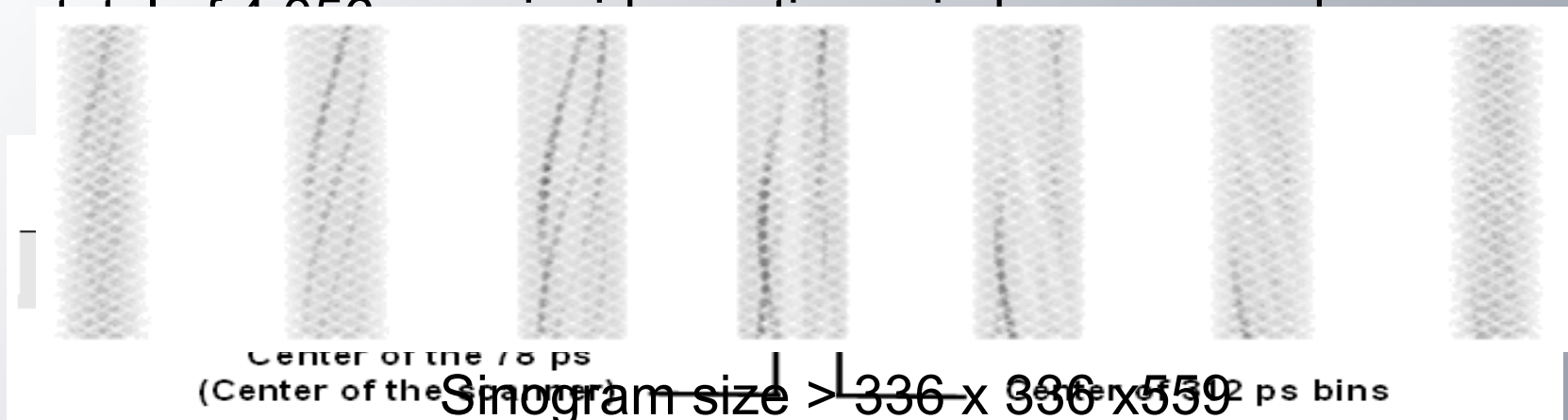


Effect of TOF in image quality

■ *Methods and materials*

✓ *TOF Sinograms*

- ▶ TOF information is encoded in the list-mode data with time bins of 78 ps. The data is later reorganized into sinograms with 312 ps time bins, four bins of 78 ps are added to form the 312 ps bins.
- ▶ A TOF sinogram with 13 TOF bins (each 312 ps wide) covering a





Effect of TOF in image quality

■ *Methods and materials*

✓ *Signal to noise ratio (SNR)*

- ▶ Defined as the difference between the lesion and background relative to the noise level in the background:

$$\mathbf{SNR} = \frac{\mathbf{Signal - Background}}{\sigma_B}$$

✓ *Contrast*

- ▶ The contrast can be used to measure the convergence of an iterative algorithm.

$$\mathbf{Contrast} = \frac{\mathbf{Signal}}{\mathbf{Background}}$$

✓ *Noise*

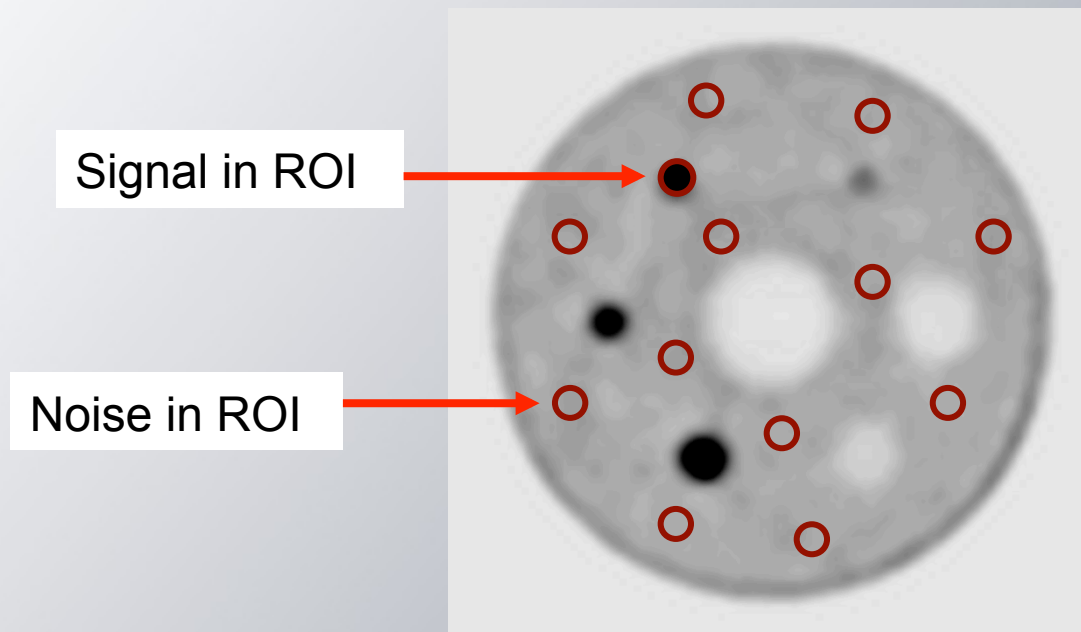
- ▶ It is defined as the ratio between the standard deviation of the background and the background level.

$$\mathbf{Noise} = \frac{\sigma_B}{\mathbf{Background}} \times 100$$

Effect of TOF in image quality

■ Acquisition method

- ▶ Several list mode acquisitions were simulated with different number of counts covering typical high and low count cases counts rates (970×10^6 , 112×10^6 , and 12×10^6 counts).
- ▶ Drawing circular regions of interest (ROIs) on the spheres as well as on the background regions (manually defined).

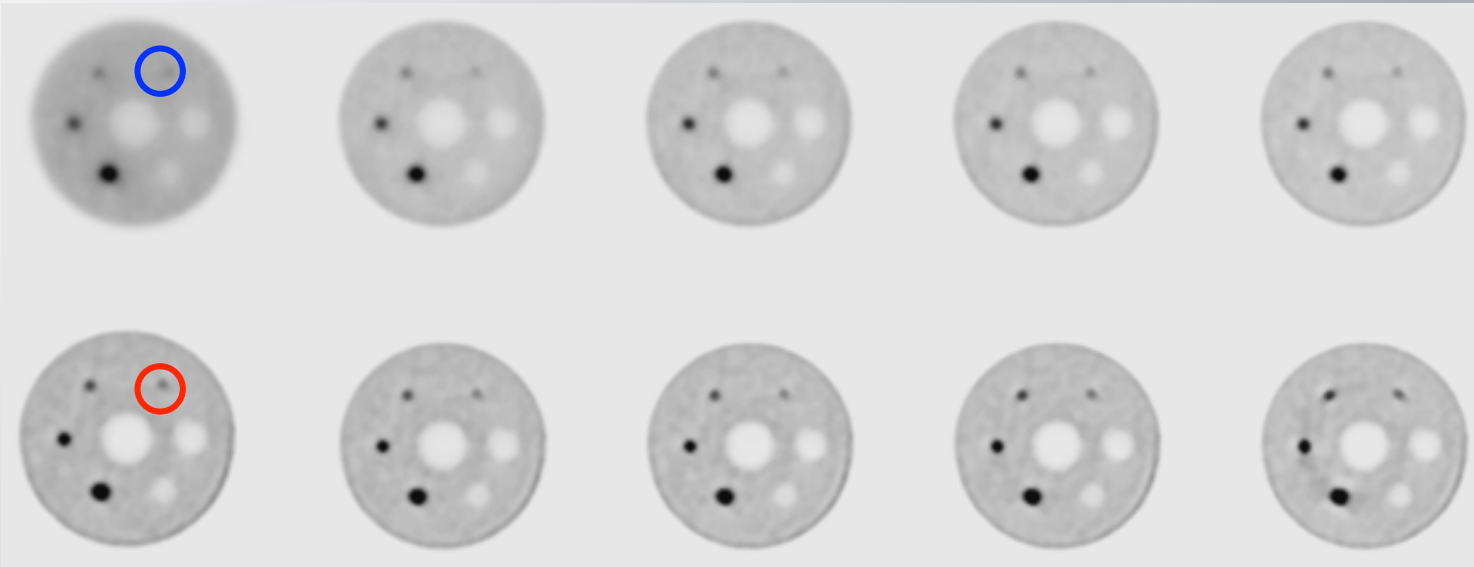


Effect of TOF in image quality

■ Reconstructed images

- ▶ A central slice of the reconstructed volume of the IQ phantom containing the hot spheres.
- ▶ Improvement in image quality can be observed for the smallest lesion (10 mm sphere) when images are reconstructed with TOF information.

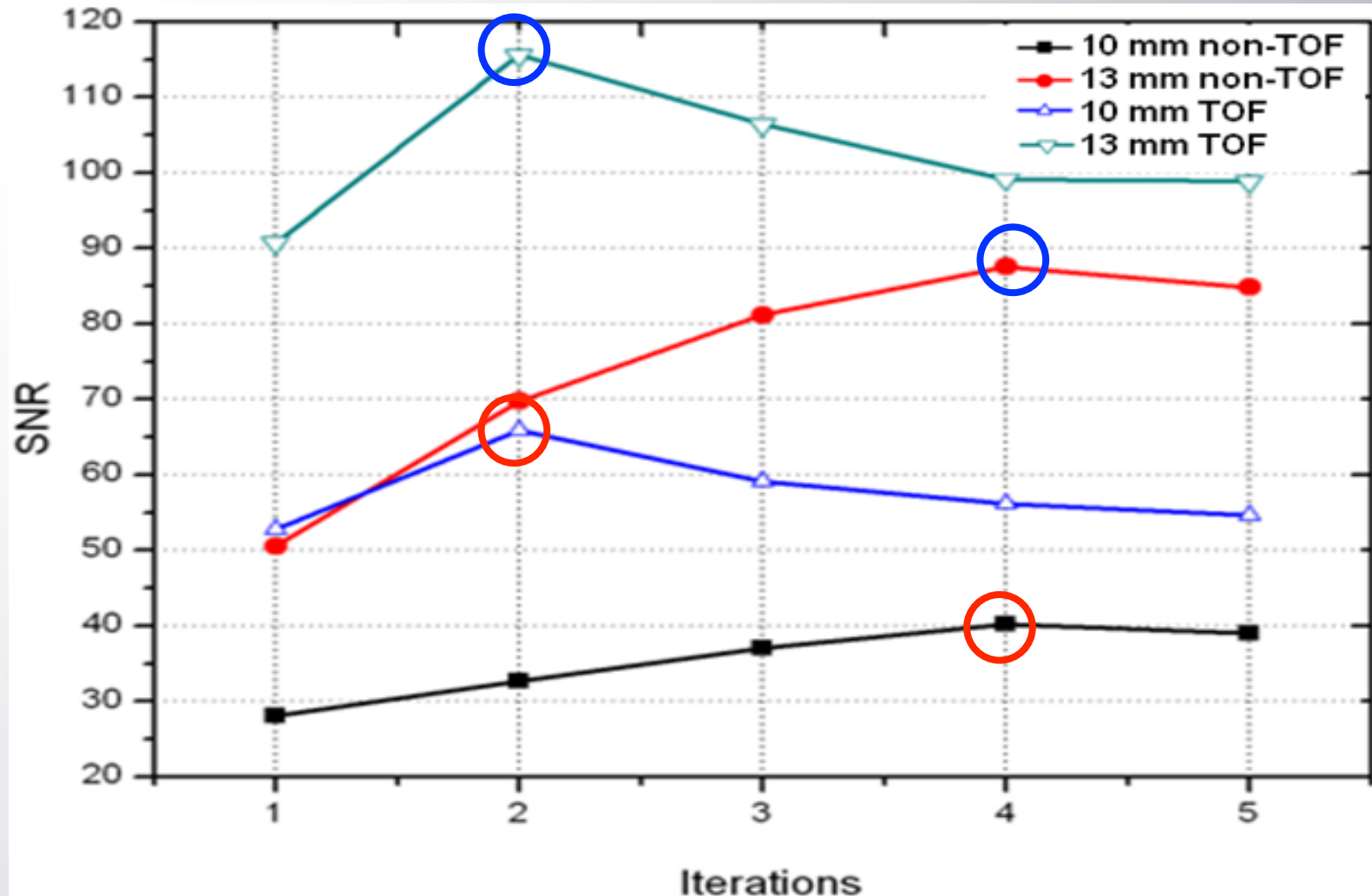
Non-TOF



TOF

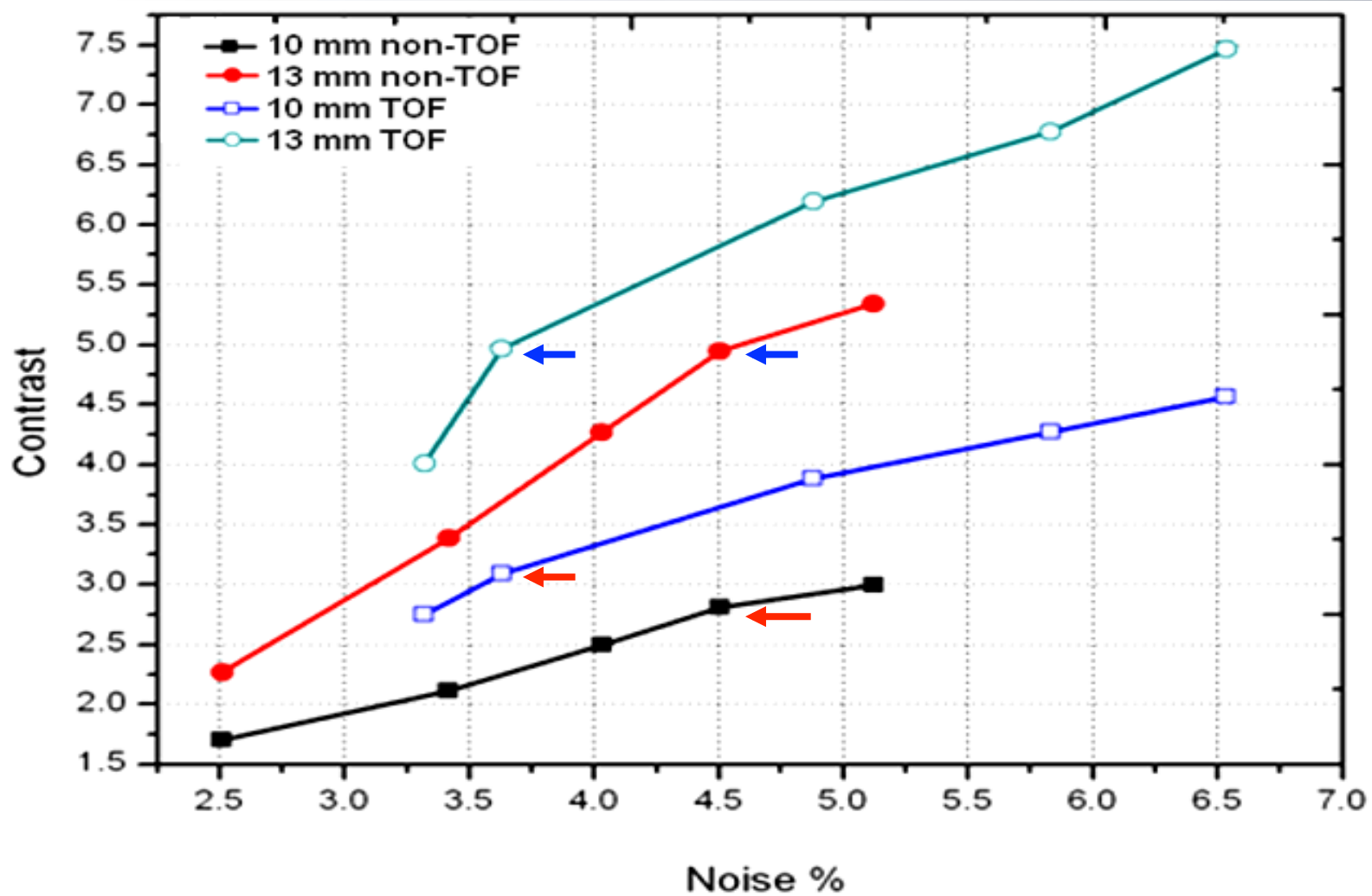
Effect of TOF in image quality

■ High statistics (970 Mcts)



Effect of TOF in image quality

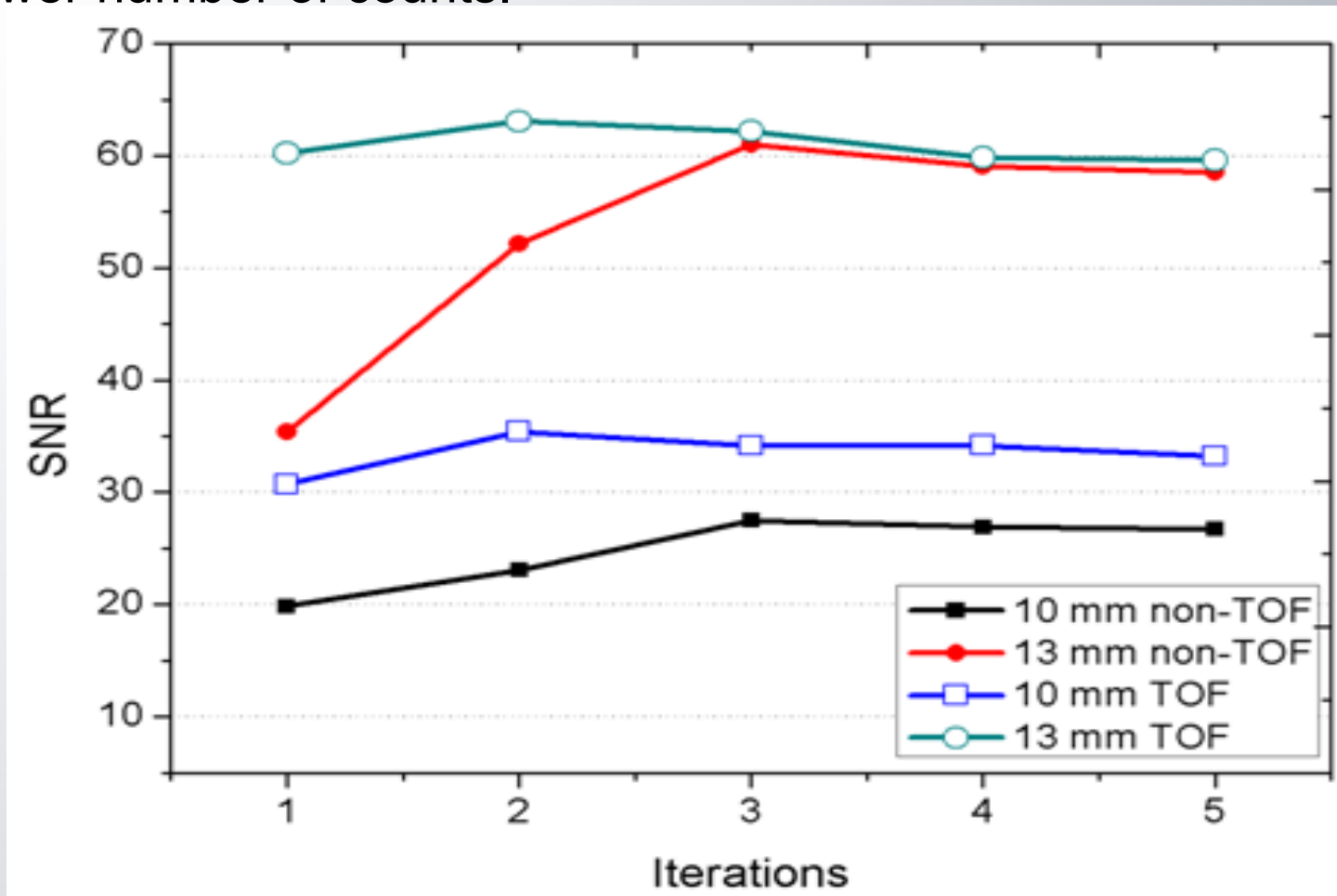
■ High statistics (970 Mcts)



Effect of TOF in image quality

■ Intermediate statistics (112 Mcts)

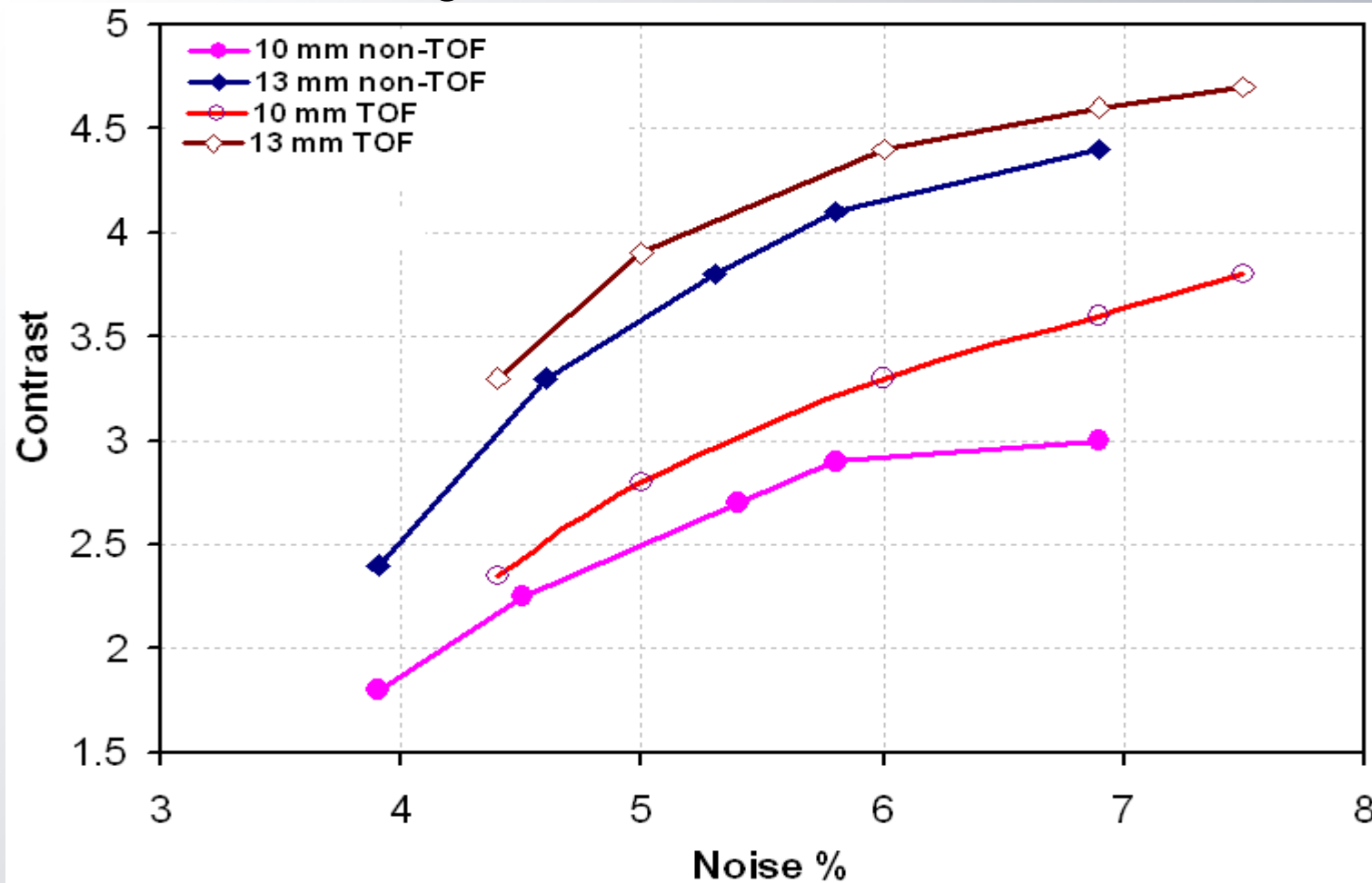
- ▶ The SNR reached is lower than in the previous case, due to the lower number of counts.



Effect of TOF in image quality

■ Intermediate statistics (112 Mcts)

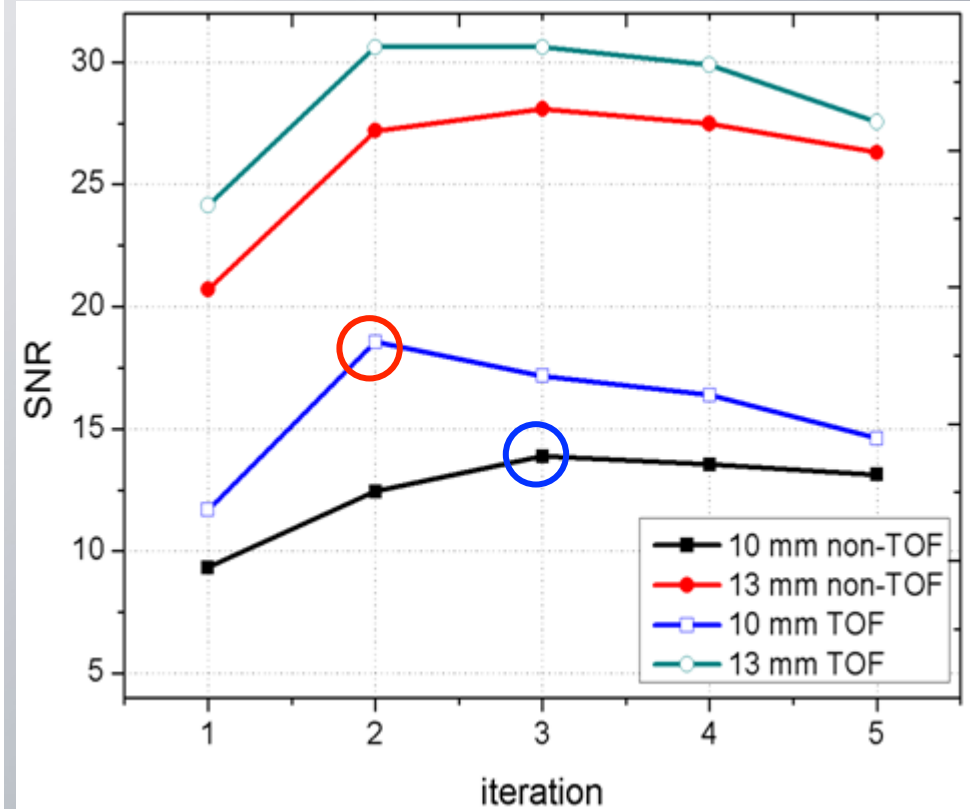
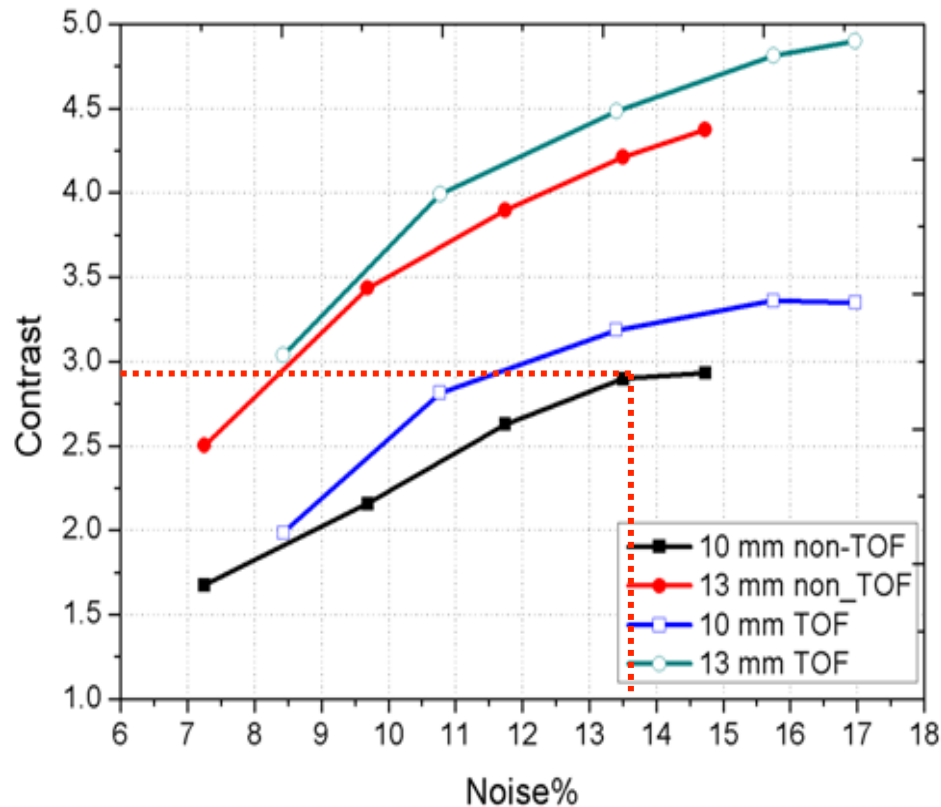
- ▶ The contrast-noise trade-off is better for TOF compared with non-TOF images.



Effect of TOF in image quality

■ *low statistics (12 Mcts)*

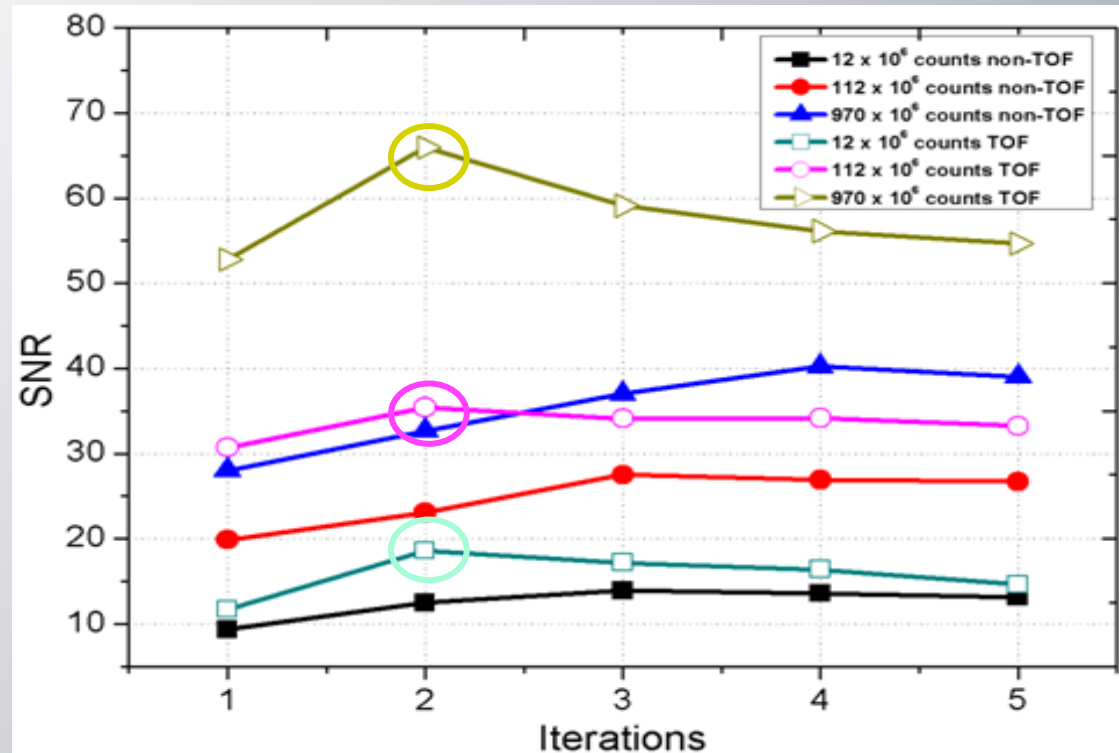
- ▶ The SNR reached is lower than in the previous case, due to the smaller number of counts.



Effect of TOF in image quality

■ Comparison of TOF and non TOF results (10 mm)

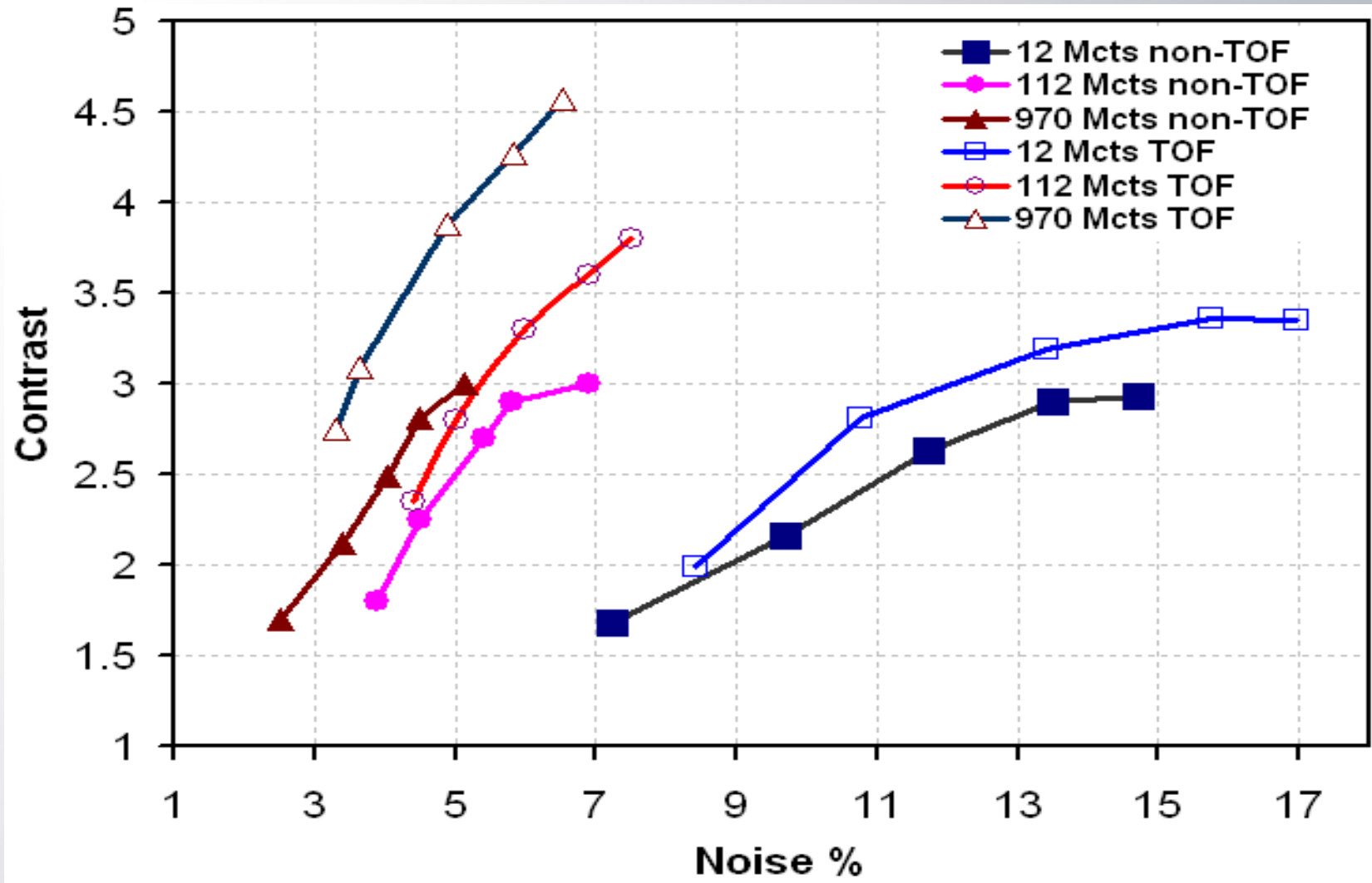
- ▶ The high-counts study has significantly higher SNR compared with the low-statistics one, for both TOF and non-TOF.
- ▶ **SNR** gain when using TOF is larger for the high-count study compared with the lower statistics one.



Counts (Mcts)	970	112	12	Real data [9]
SNR _{gain}	2.0	1.6	1.5	1.2 to 2

Effect of TOF in image quality

■ Comparison of TOF and non TOF results (10 mm)



Effect of TOF in image quality

■ Conclusion

- ▶ GFIRST is flexible to include PSF, median filter and TOF information, with low reconstruction time (**1 minute per iteration in a 500 EUR GPU card**), so that it could be used for real clinical TOF PET scanners.
- ▶ This was expected, due to the better localization of the annihilation events when TOF is included .

Table of contents

1. Introduction and Objectives
2. Simulation of clinical PET scanners
3. Image reconstruction
4. General Conclusions

Main contributions of this thesis

- ▶ A PET Monte Carlo simulation tool (PeneloPET) has been extended and validated for clinical scanners.
- ▶ We have shown that PeneloPET is capable of incorporating TOF properties of the scanners in the simulation. This is of paramount importance to describe modern clinical PET systems.
- ▶ The reconstruction software GFIRST was modified to incorporate TOF information.
- ▶ The incorporation of TOF information results in better contrast/noise trade-off.



Main contributions of this thesis

- ▶ It has been shown quantitatively that the SNR gain due to TOF has larger effect in higher count acquisitions, provided the activity level is low.

■ Simulation speed (B-TPTV)

<i>Processor</i>	<i>Simulation speed (NEC NEMA)</i>	<i>GFIRST speed</i>
<i>Intel(R) Xeon(R) CPU <u>E5-2650@2.00GHz</u> (16 threads)</i>	<i>3000 detected coincidences per wall clock second</i>	<i>1 Minute per iteration (NVIDIA, GPU – TESLA C1060–4 GB – 27SM)</i>

- ▶ The simulation speed with a total of 16 PeneloPET threads working in the same processor (eight cores) achieves nearly 3000 detected coincidences per wall clock second at the peak of the NEC NEMA simulation.
- ▶ It is possible to obtain several million counts in a couple of hours.



Goals achieved

Preclinical
area

Attention
Clinical
area !





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Grupo de Física Nuclear



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