

Spatially Variant Resolution Modelling for Iterative List-Mode PET Reconstruction

Matthew Bickell, Lin Zhou, Johan Nuyts

Medical Imaging Research Centre
KULeuven, Belgium

KATHOLIEKE UNIVERSITEIT
LEUVEN



Resolution modelling

Accurate system modelling can improve resolution

In MLEM:

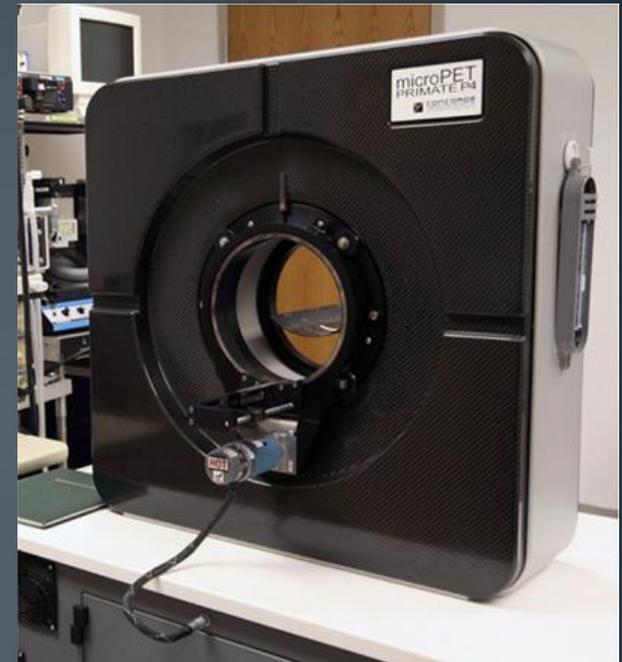
1. The forward projection simulates a measurement process
2. The resulting projection is compared to the measured data
3. The result is backprojected and used as an update

Resolution modelling

A standard approach with MLEM:

Convolve the image with a Gaussian

- before forward projection, and
- after backprojection



microPET FOCUS-220

Gaussian FWHM = 1.3 mm^[1]

[1] Tai, Y., et al, "Performance evaluation of the microPET focus: a third-generation microPET scanner dedicated to animal imaging.", *J. Nucl. Med.*, 46:3, 2005

The measurement process

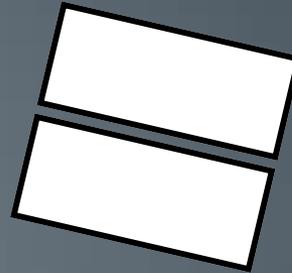
Positron range

Photon acollinearity

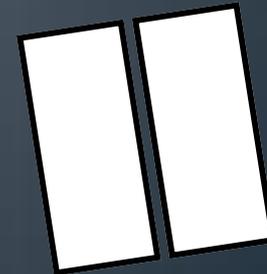
Detector response

Inter-crystal scatter

Crystal crosstalk



 e^+ emission



The measurement process

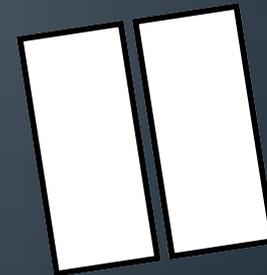
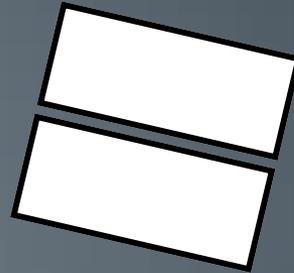
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



The measurement process

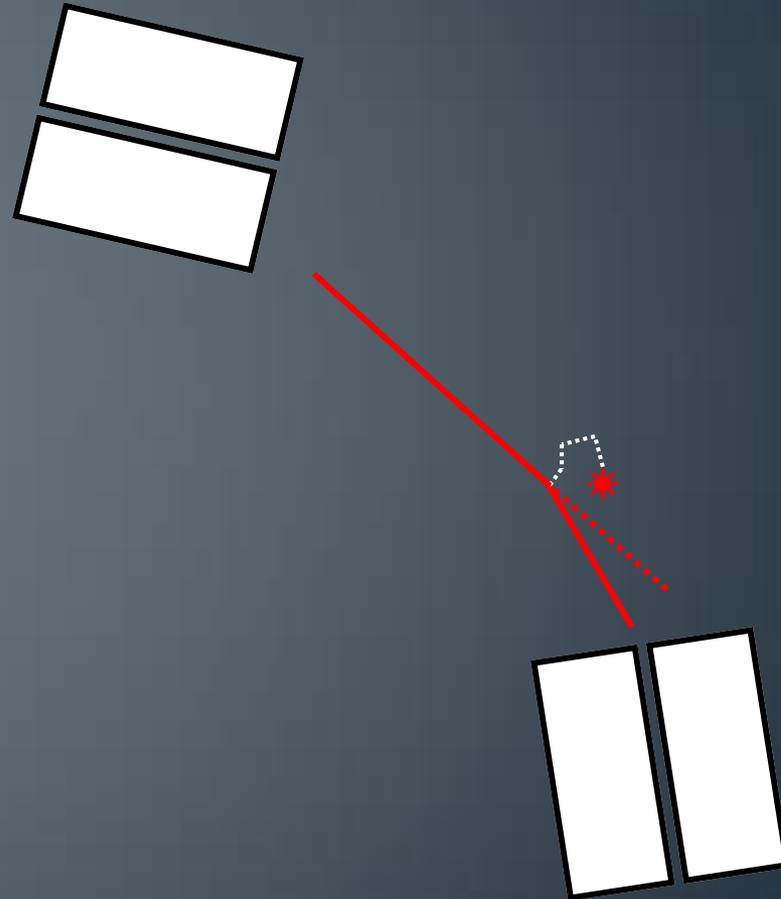
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



The measurement process

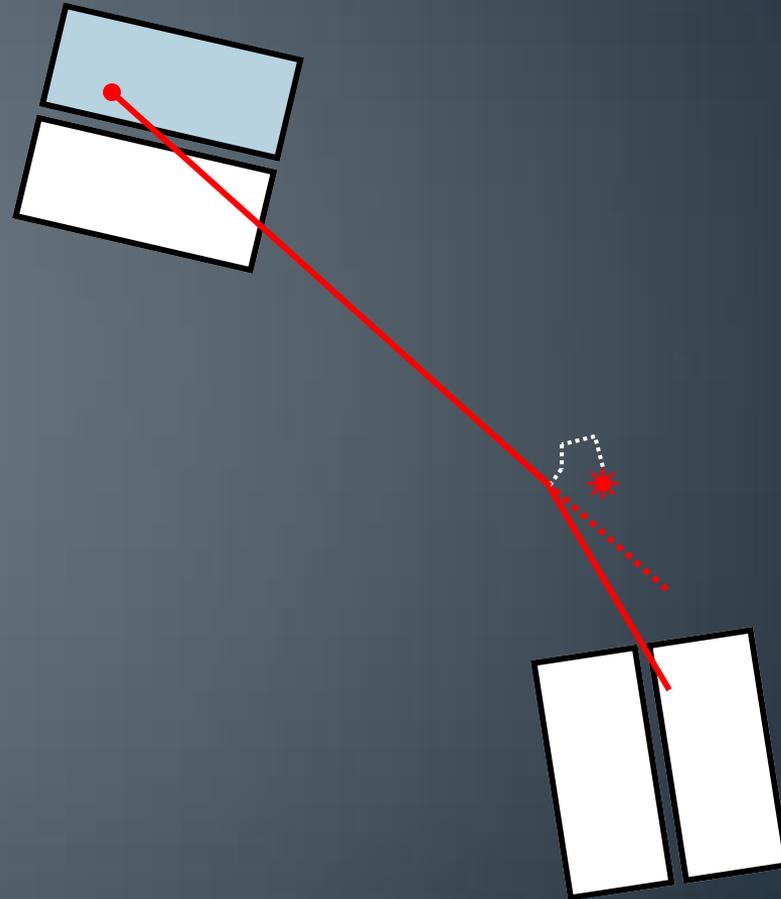
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



The measurement process

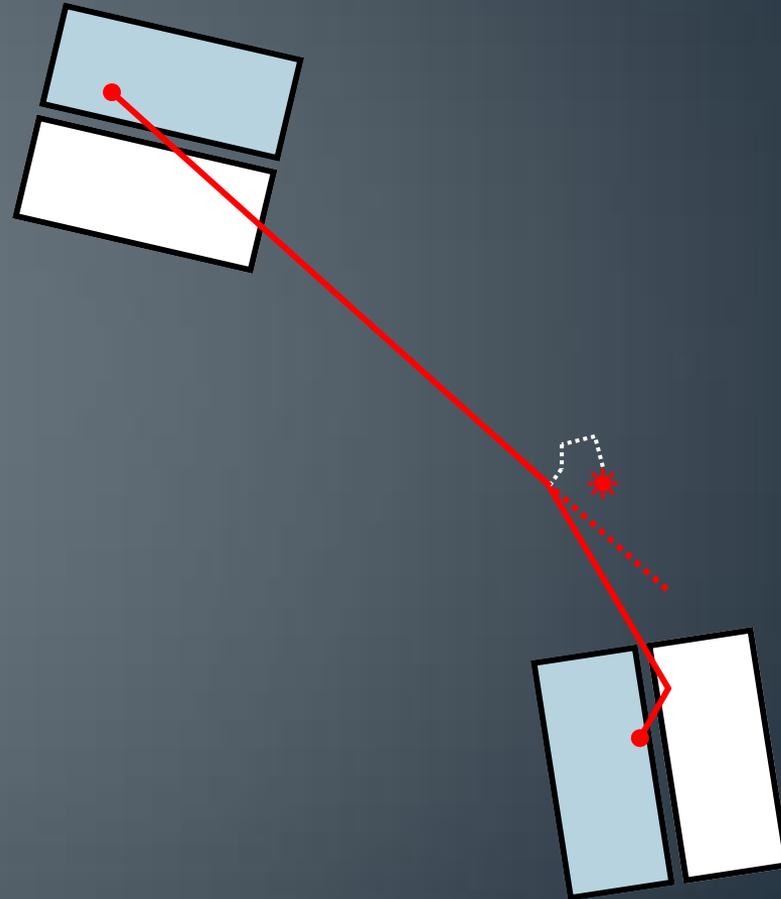
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



The measurement process

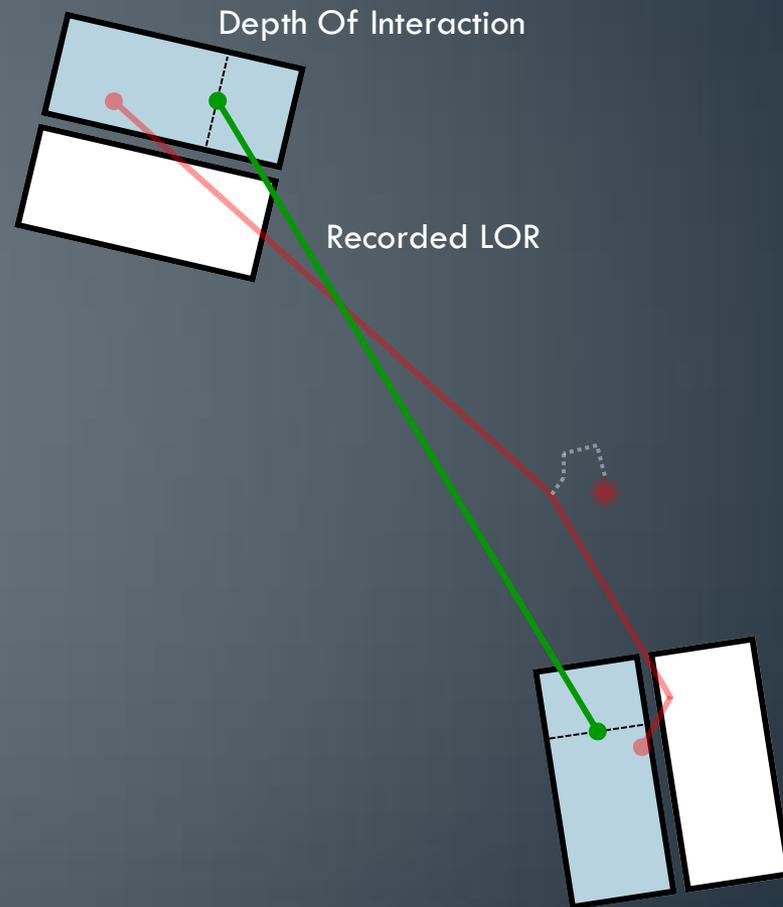
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



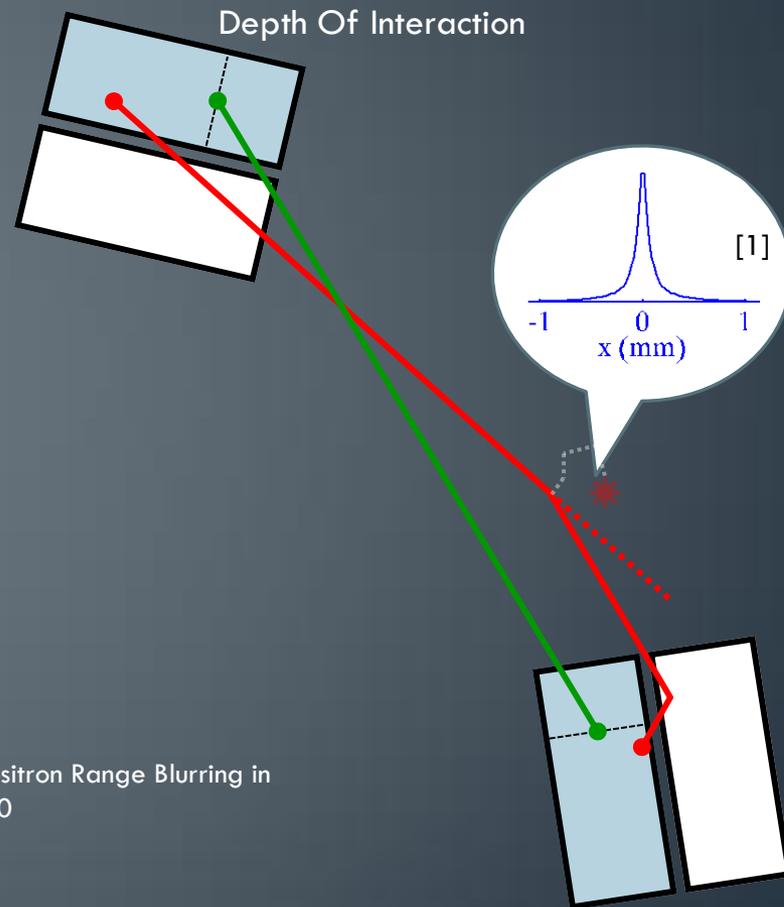
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



[1] Haber, S. F., et al, "Application of Mathematical Removal of Positron Range Blurring in Positron Emission Tomography", *IEEE Trans. Nuc. Sci.*, 37:3, 1990

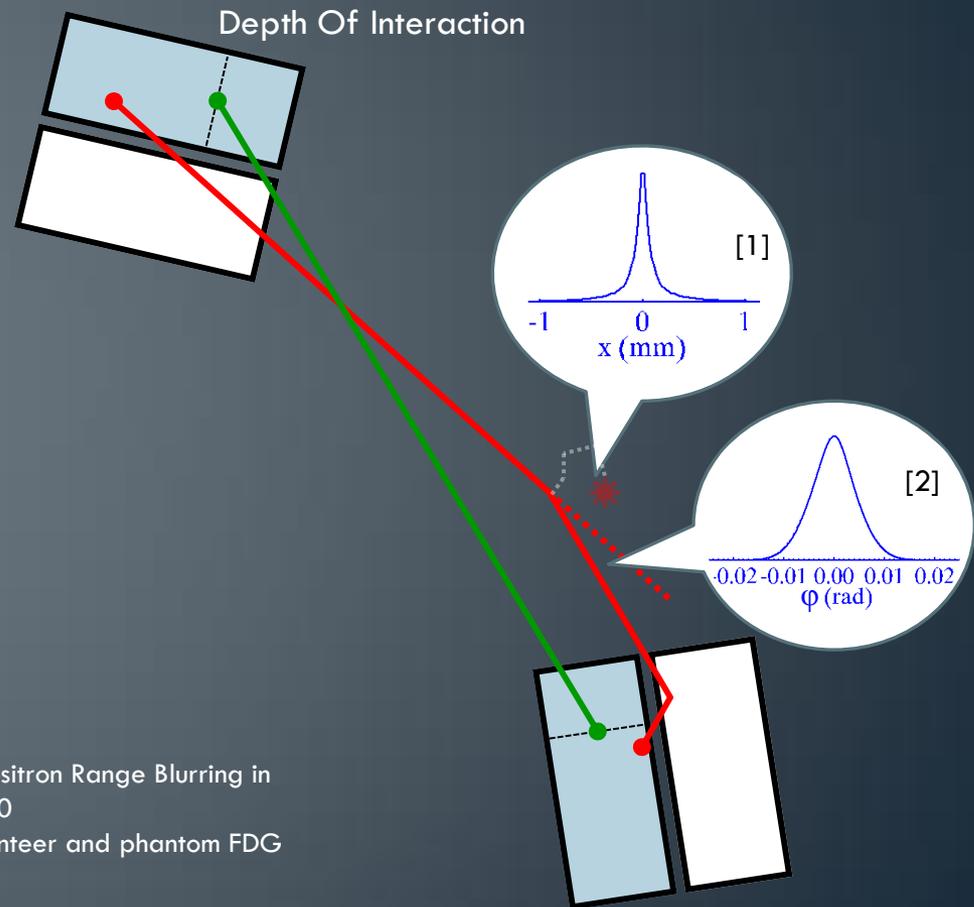
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



[1] Haber, S. F., et al, "Application of Mathematical Removal of Positron Range Blurring in Positron Emission Tomography", *IEEE Trans. Nuc. Sci.*, 37:3, 1990

[2] Shibuya, K., et al, "Annihilation photon acollinearity in PET: volunteer and phantom FDG studies", *Phys. Med. Biol.*, 52:17, 2007

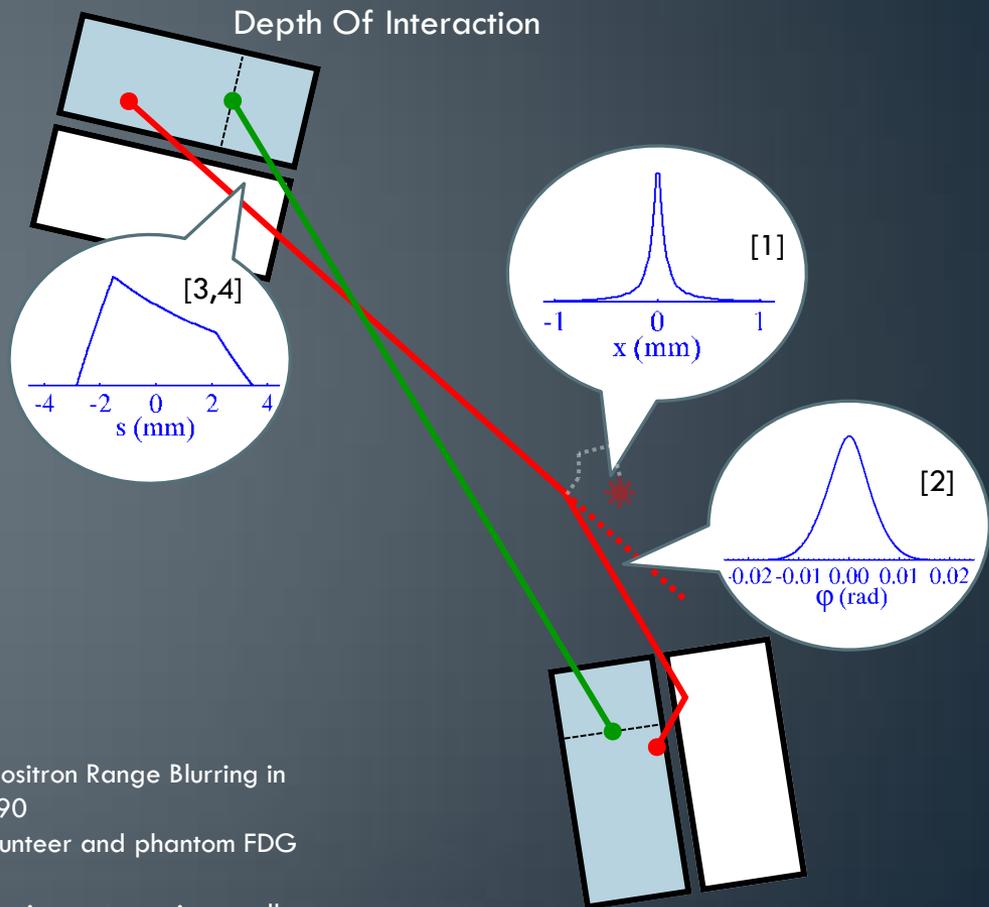
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



[1] Haber, S. F., *et al*, "Application of Mathematical Removal of Positron Range Blurring in Positron Emission Tomography", *IEEE Trans. Nuc. Sci.*, 37:3, 1990

[2] Shibuya, K., *et al*, "Annihilation photon acollinearity in PET: volunteer and phantom FDG studies", *Phys. Med. Biol.*, 52:17, 2007

[3] Lecomte, R., *et al*, "Geometric study of high resolution PET detection system using small detectors", *IEEE Trans. Nuc. Sci.*, 31:1, 1984

[4] Liang, Z., "Detector response restoration in image reconstruction of high resolution positron emission tomography", *IEEE Trans. Med. Imag.*, 13:2, 1994

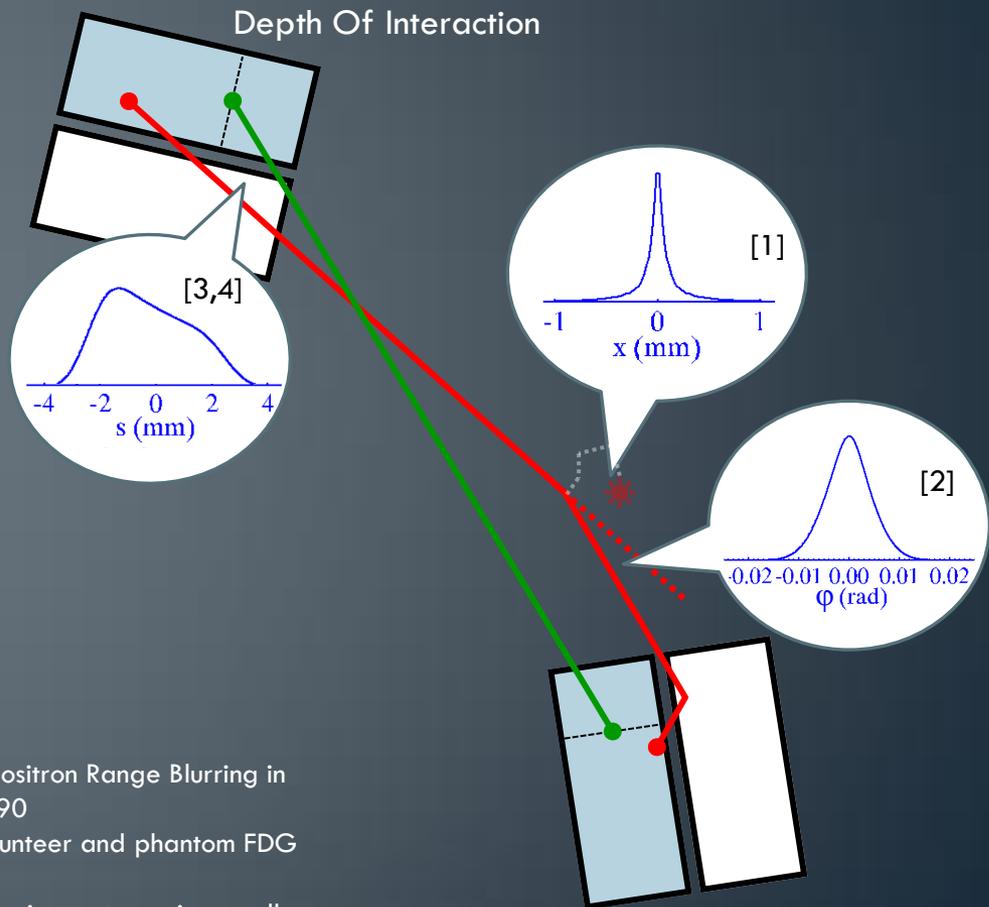
Positron range

Photon acollinearity

Detector response

Inter-crystal scatter

Crystal crosstalk



[1] Haber, S. F., *et al*, "Application of Mathematical Removal of Positron Range Blurring in Positron Emission Tomography", *IEEE Trans. Nuc. Sci.*, 37:3, 1990

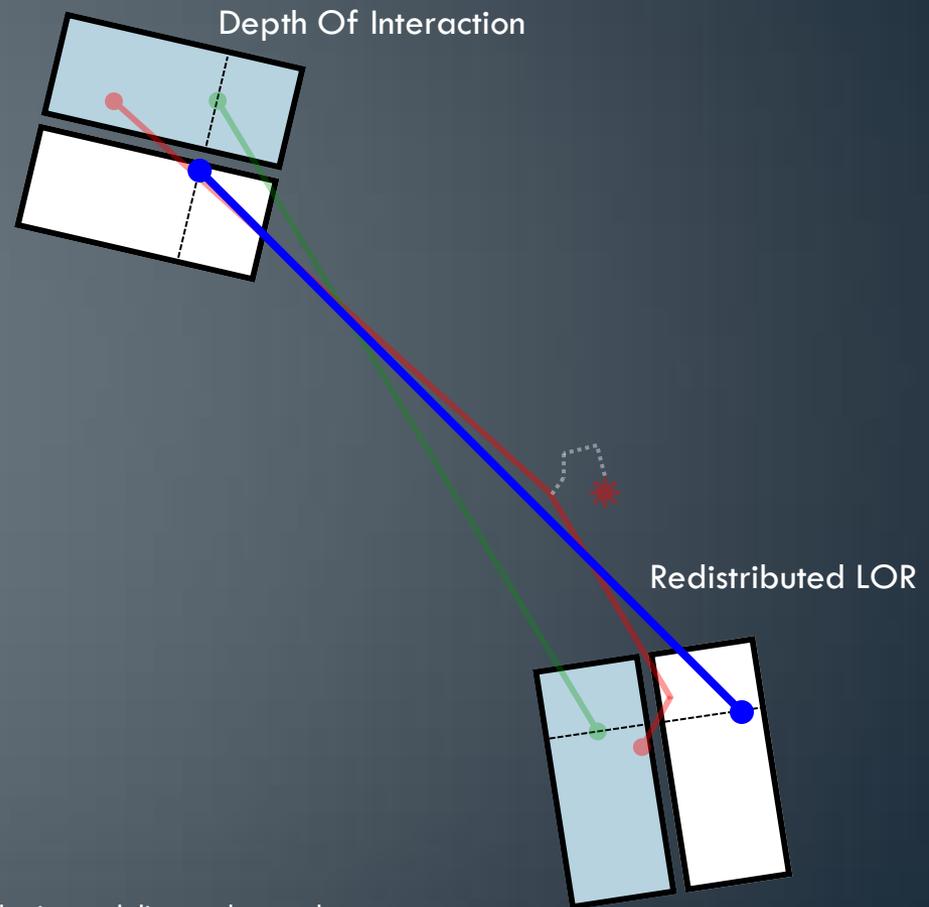
[2] Shibuya, K., *et al*, "Annihilation photon acollinearity in PET: volunteer and phantom FDG studies", *Phys. Med. Biol.*, 52:17, 2007

[3] Lecomte, R., *et al*, "Geometric study of high resolution PET detection system using small detectors", *IEEE Trans. Nuc. Sci.*, 31:1, 1984

[4] Liang, Z., "Detector response restoration in image reconstruction of high resolution positron emission tomography", *IEEE Trans. Med. Imag.*, 13:2, 1994

Redistribute LORs accordingly

Many redistributed LORs create
an effective tube-of-response

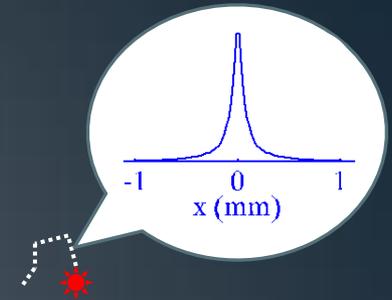


Jin, X., et al, "List-mode reconstruction for the Biograph mCT with physics modeling and event-by-event motion correction", *Phys. Med. Biol.*, 58:16, 2013

Gillam, J., et al, "Simulated one-pass list-mode: an approach to on-the-fly system matrix calculation", *Phys. Med. Biol.*, 58:7, 2013

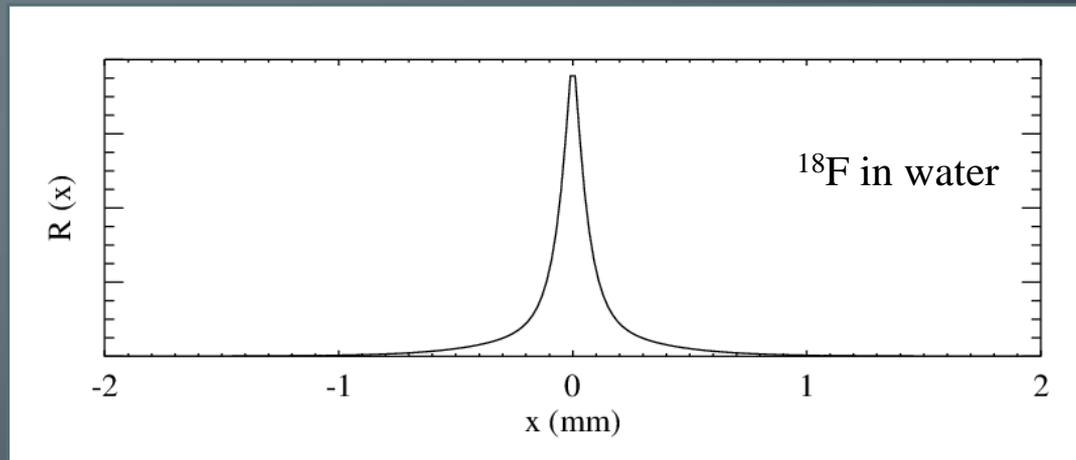
The Distributions

Positron range convolution



The positron range can be described by:

$$R(x) = Ae^{-x/B} + (1 - A)e^{-x/C} \quad [1]$$



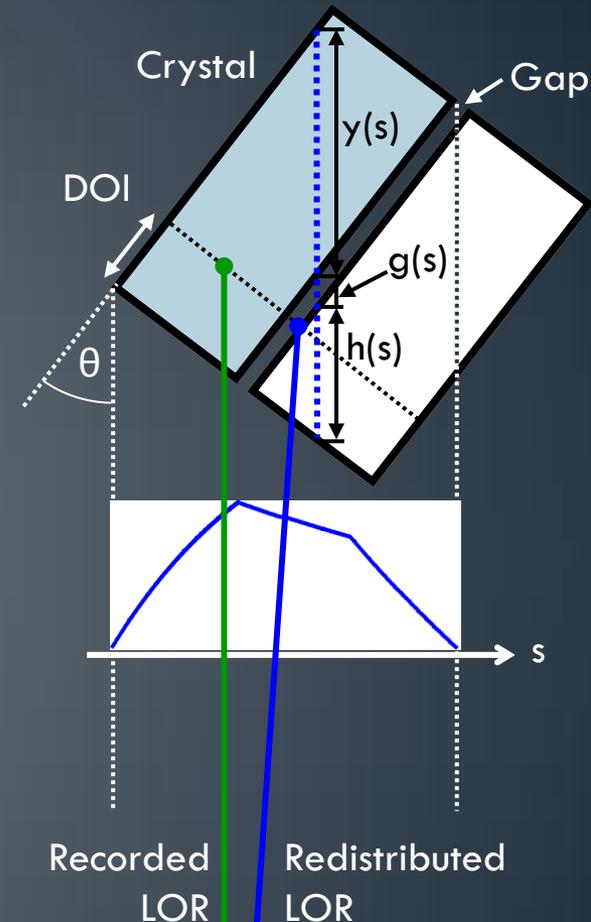
[1] Haber, S. F., et al, "Application of Mathematical Removal of Positron Range Blurring in Positron Emission Tomography", *IEEE Trans. Nuc. Sci.*, 37:3, 1990

The Distributions

Detector response function

$$P_{\theta}(s) = \left(1 - e^{-\mu_c y(s)}\right) e^{-\mu_c h(s) - \mu_g g(s)} \quad [1]$$

s	Length parameter orthogonal to LOR
$y(s)$	Path length through this crystal
$h(s)$	Path length through neighbouring crystal
$g(s)$	Path length through gaps
μ_c	Attenuation of crystals
μ_g	Attenuation of gap material (BaSO_4) ^[2]



Crystal width = 1.510 mm

Transaxial gap width = 0.120 mm

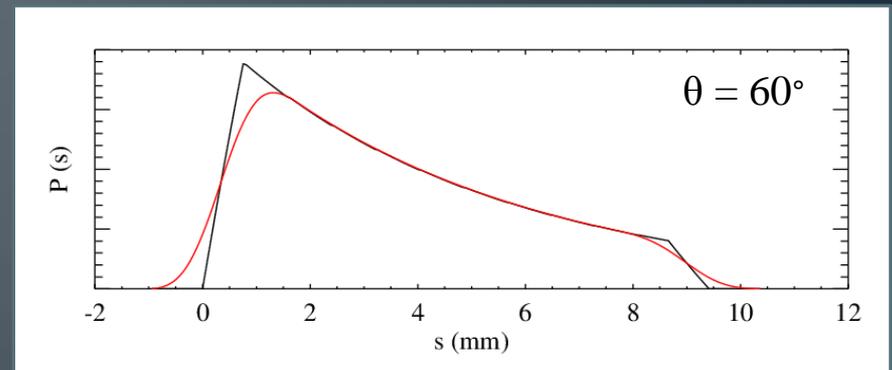
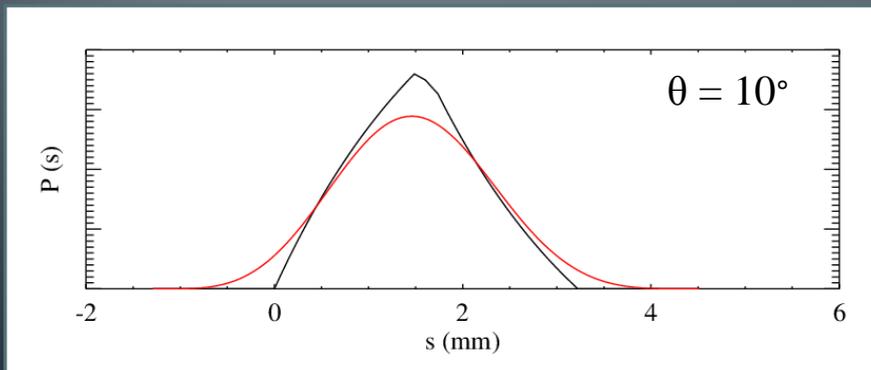
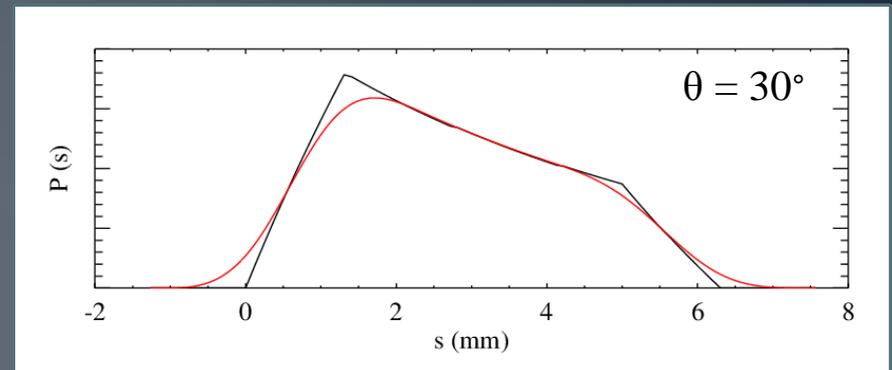
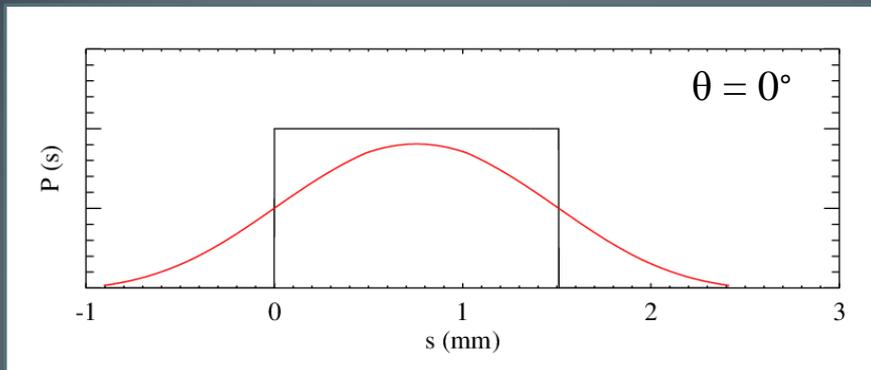
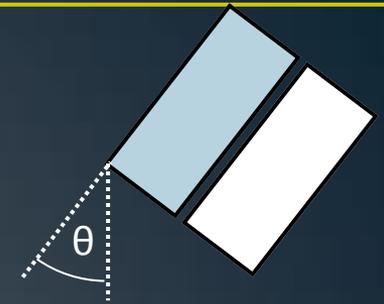
Axial gap width = 0.082 mm

[1] Lecomte, R., et al, "Geometric study of high resolution PET detection system using small detectors", *IEEE Trans. Nuc. Sci.*, 31:1, 1984

[2] Tai, Y-C, et al, "MicroPET II: design, development and initial performance of an improved microPET scanner for small-animal imaging", *Phys. Med. Biol.*, 48, 2003

The Distributions

Detector response function



— before convolution
— after convolution

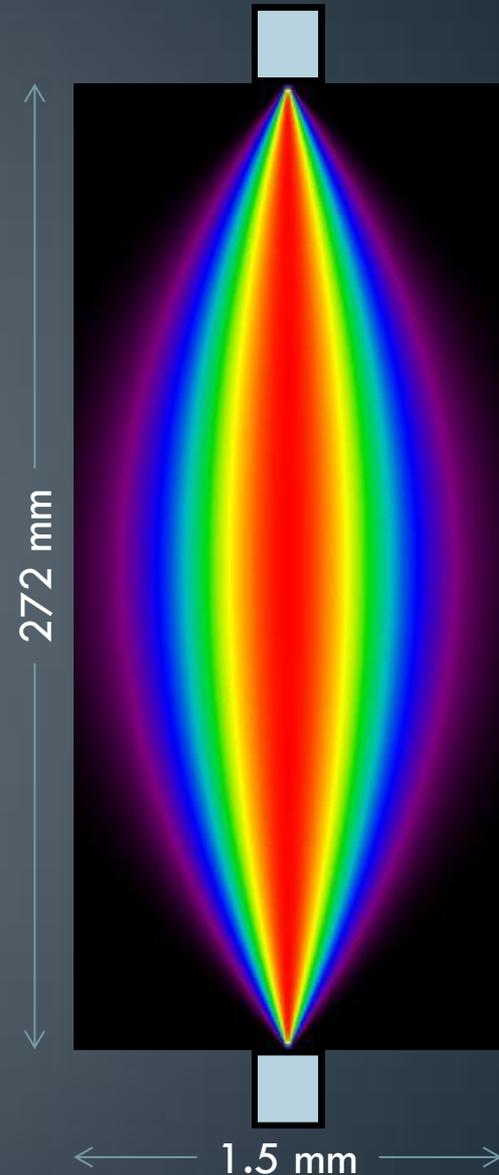
The Distributions

Acollinearity distribution

The angular deviation is best described by a double Gaussian:

$$Q(\phi) = A_1 e^{-\frac{(\phi - \mu_1)^2}{2\sigma_1^2}} + A_2 e^{-\frac{(\phi - \mu_2)^2}{2\sigma_2^2}} \quad [1]$$

A	0.824	0.176
μ (deg)	-0.009	0.007
σ (deg)	0.269	0.116



[1] Shibuya, K., et al, "Annihilation photon acollinearity in PET: volunteer and phantom FDG studies", *Phys. Med. Biol.*, 52:17, 2007

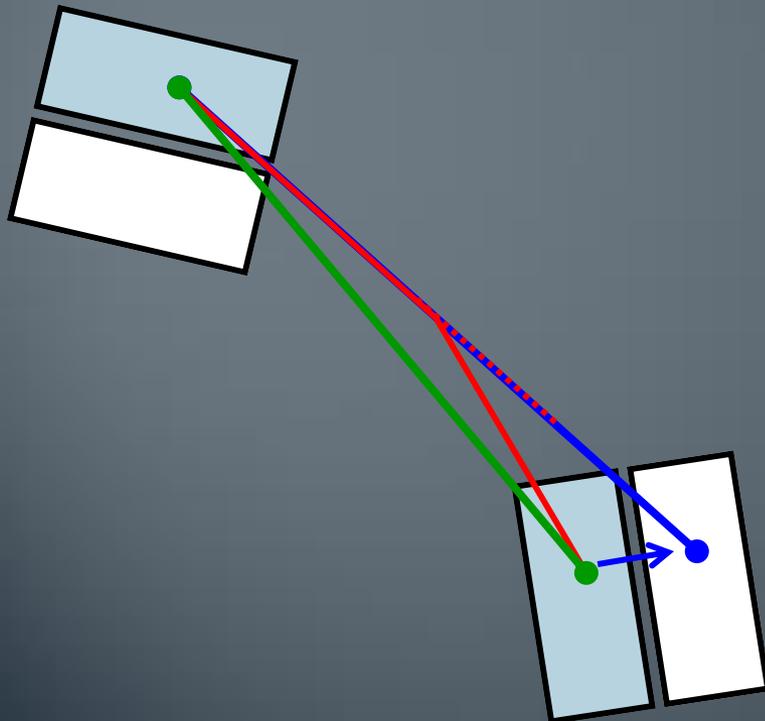
The Distributions

Acollinearity distribution

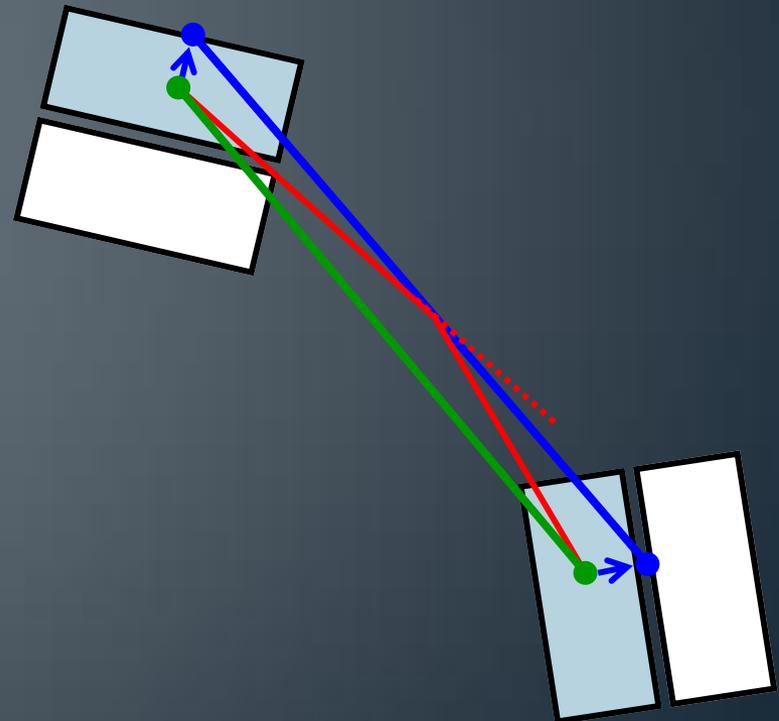
The LOR can be redistributed by either:

shifting one endpoint, or...

...shifting both endpoints



Theoretical distribution



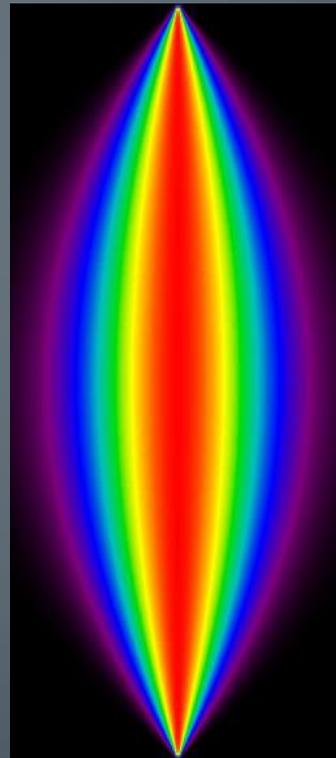
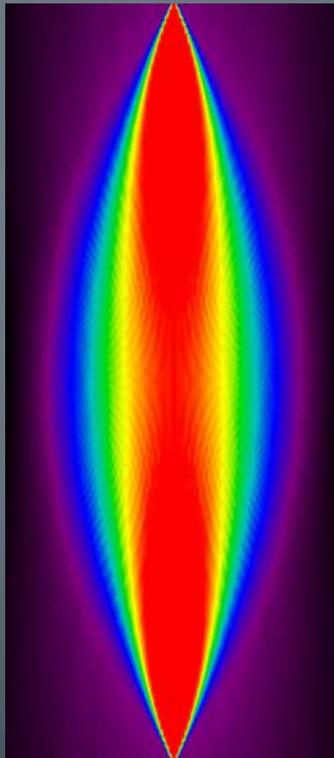
The Distributions

Acollinearity distribution

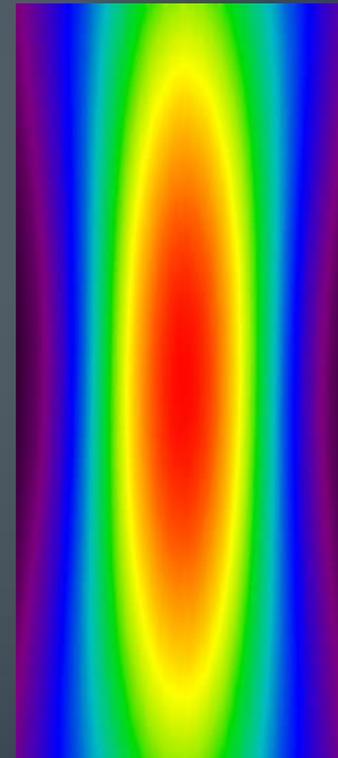
The LOR can be redistributed by either:

shifting one endpoint, or...

...shifting both endpoints



Theoretical distribution



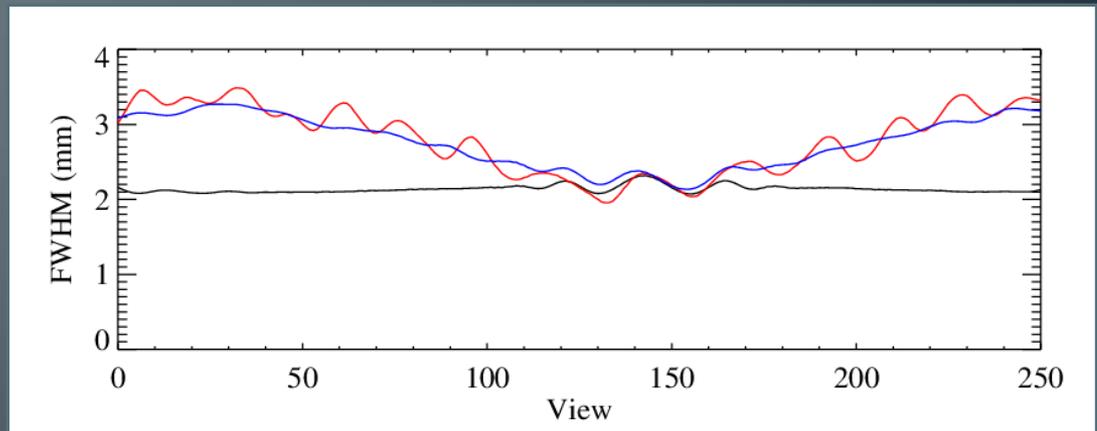
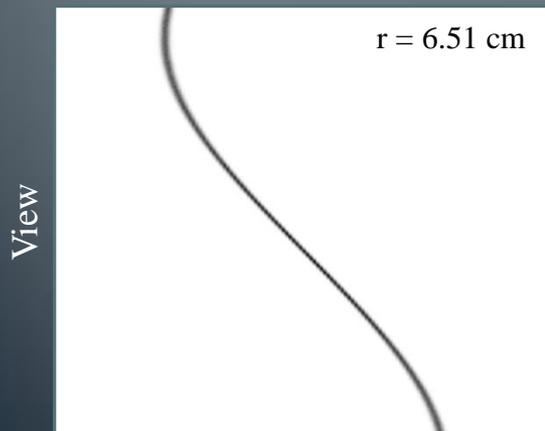
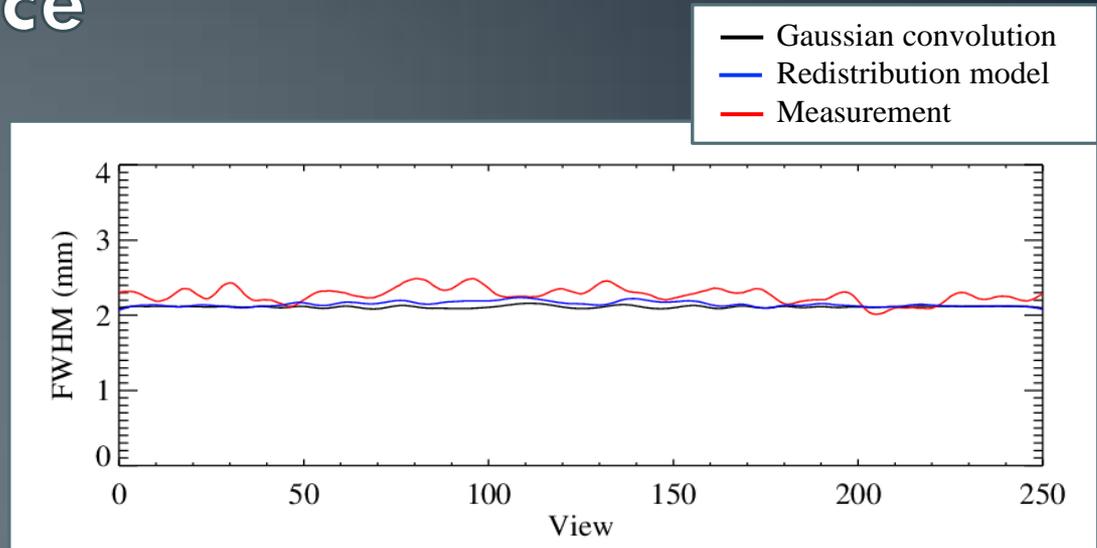
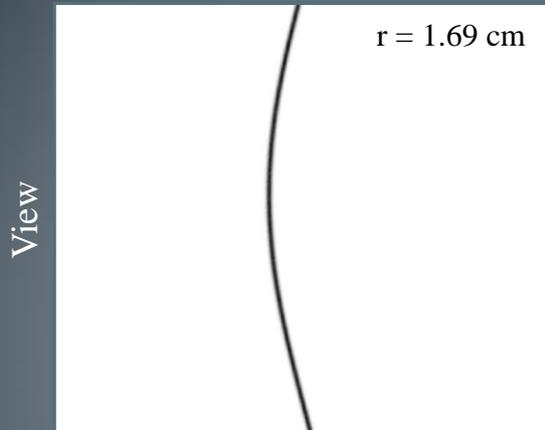
Implementation

1. LORs are redistributed twice, independently:
once for forward projection and once for backprojection
2. List-mode MLEM reconstruction with subsets
3. LORs are resampled after every iteration

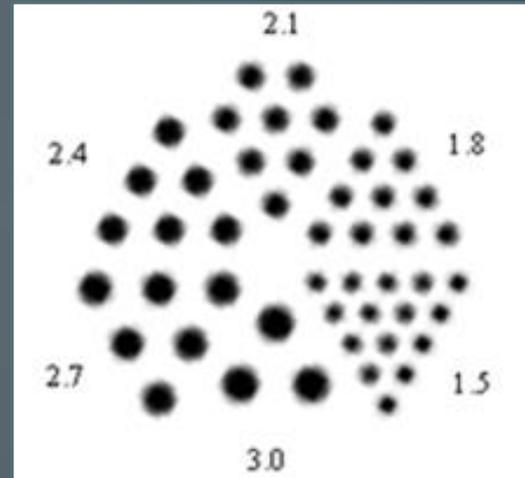
Spatial Variance

1. Point sources were measured
2. Point sources were simulated
3. Simulated point sources were forward projected:
 - A. after convolution with a Gaussian, and,
 - B. using redistributed LORs.
4. The sinogram profiles were compared

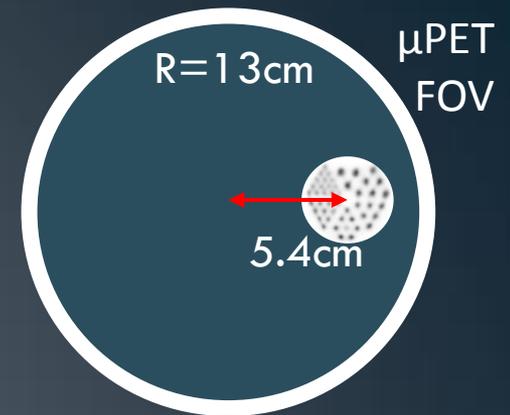
Spatial Variance



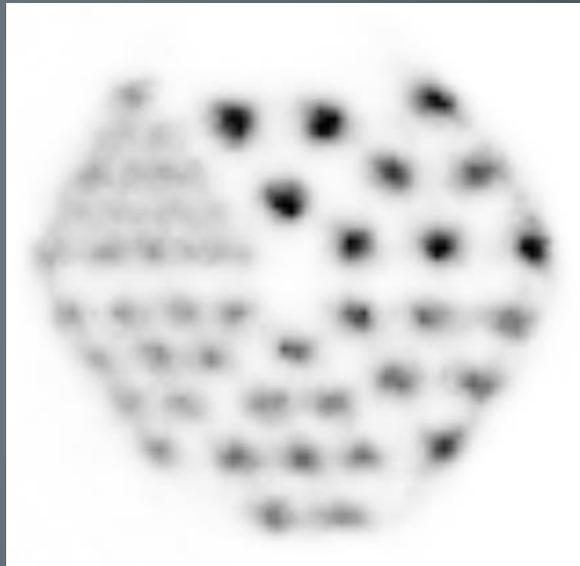
Phantom Reconstructions



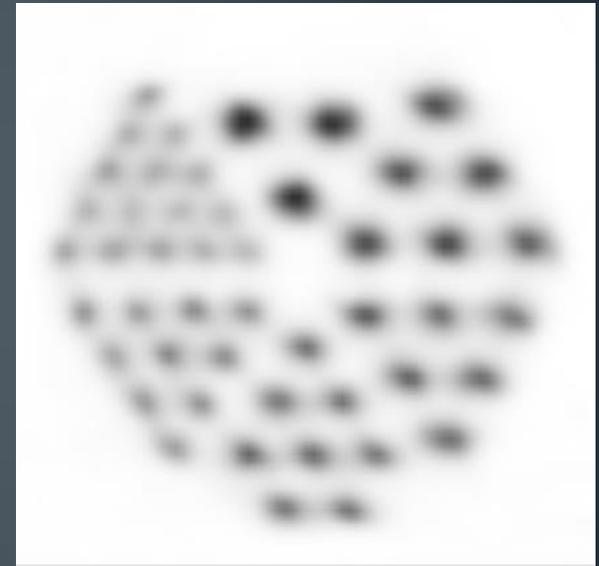
Phantom Reconstructions



No resolution modelling



Redistribution



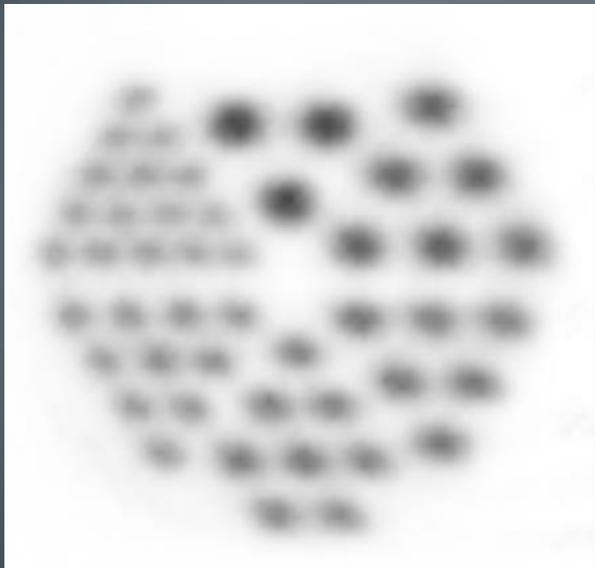
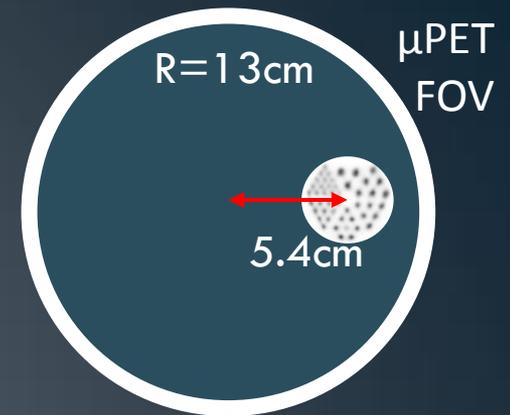
Gaussian convolution

Pixel: 0.4745 mm
10 iterations , 10 subsets

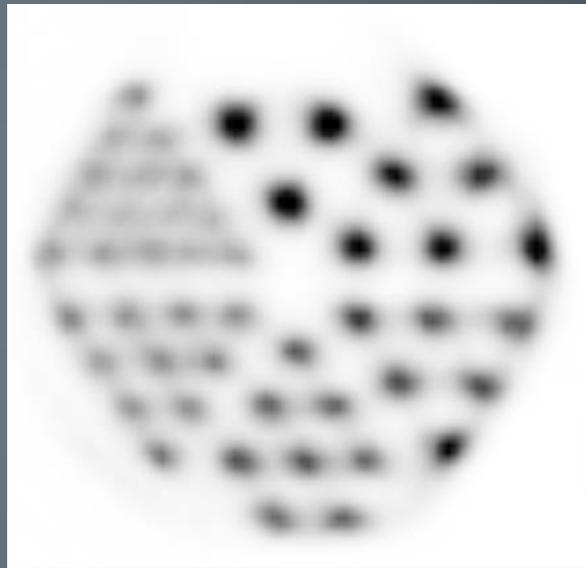
Scan time: 5 minutes
Activity: 1.2 mCi of FDG
LORs: 150 million

Phantom Reconstructions

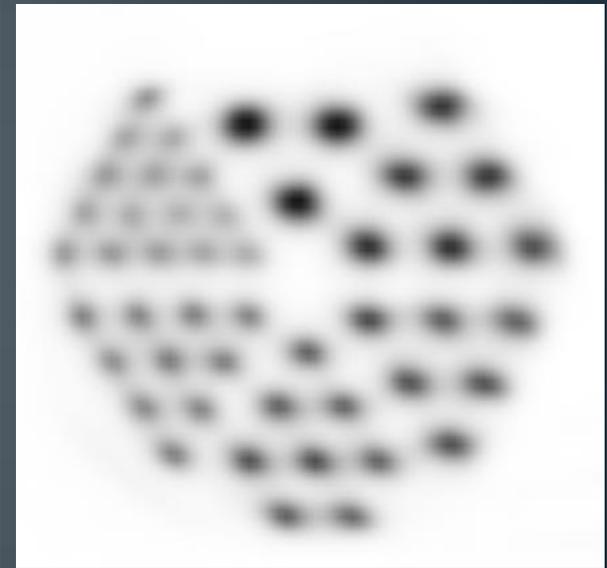
Summing 10
planes together



No resolution modelling



Redistribution



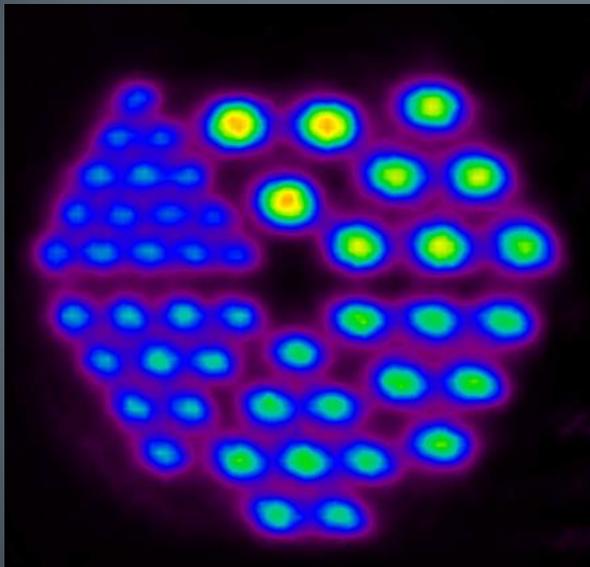
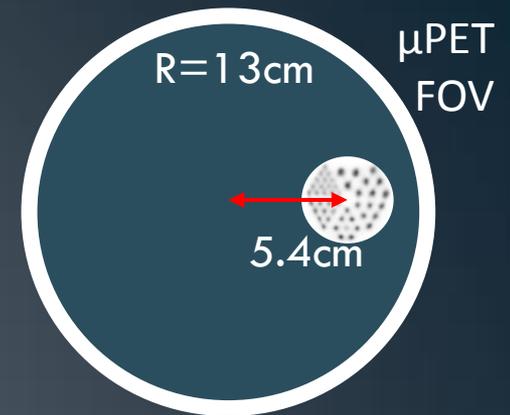
Gaussian convolution

Pixel: 0.4745 mm
10 Iterations , 10 subsets

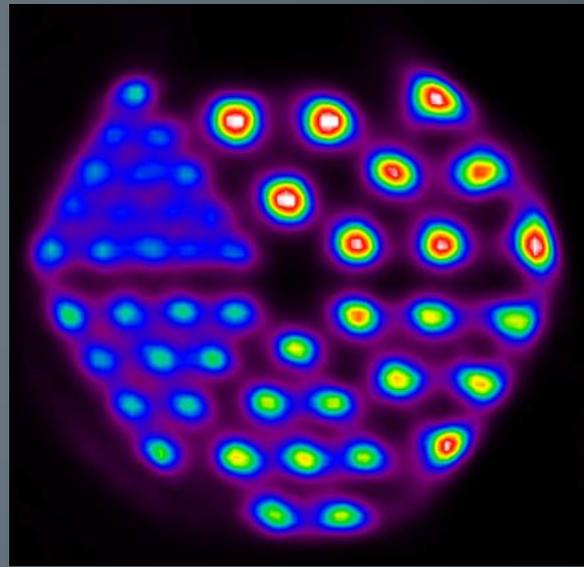
Scan time: 5 minutes
Activity: 1.2 mCi of FDG
LORs: 150 million

Phantom Reconstructions

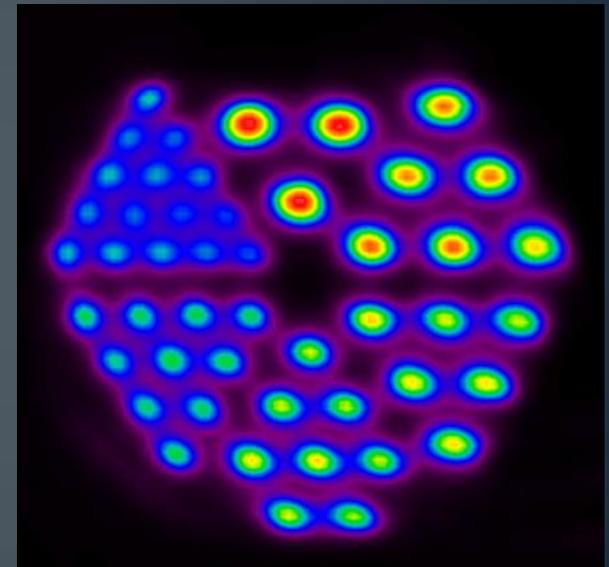
Summing 10
planes together



No resolution modelling



Redistribution

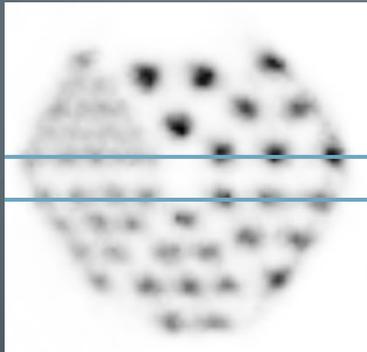


Gaussian convolution

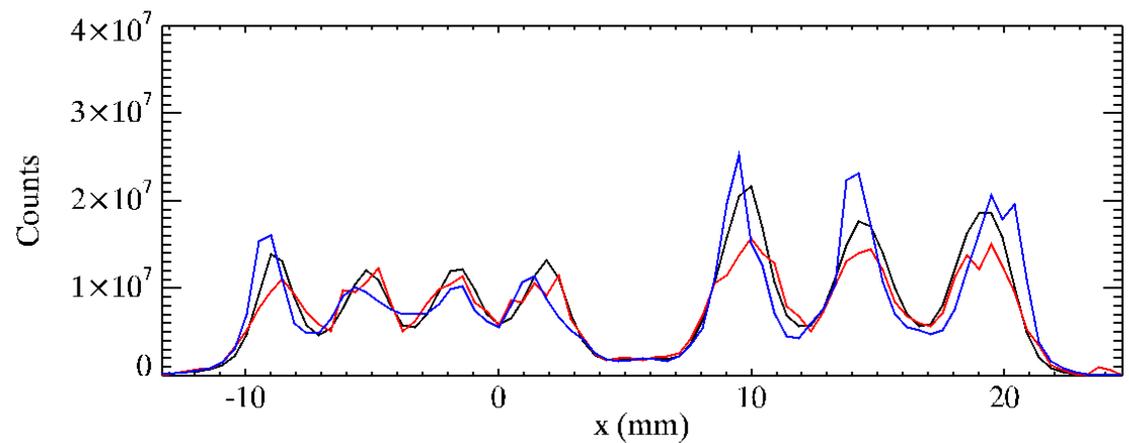
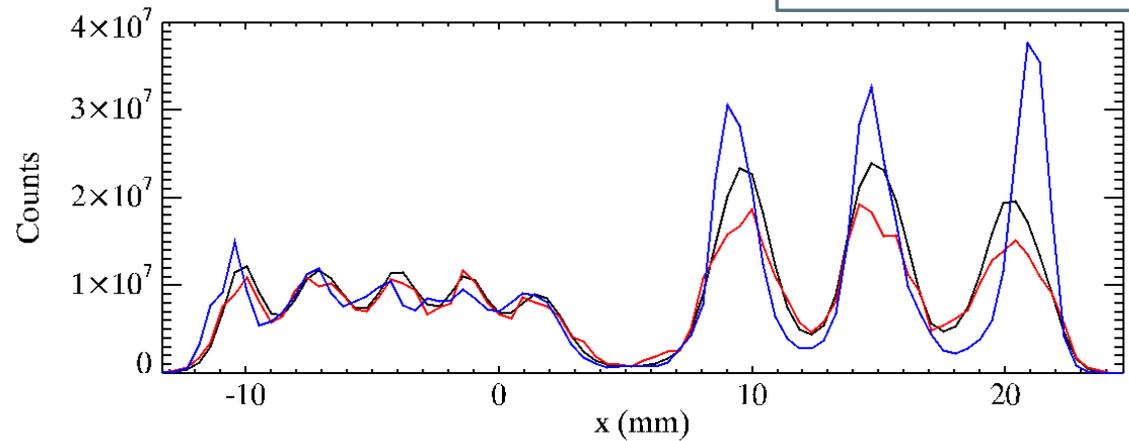
Pixel: 0.4745 mm
10 iterations, 10 subsets

Scan time: 5 minutes
Activity: 1.2 mCi of FDG
LORs: 150 million

Phantom Reconstructions



- Gaussian convolution
- Redistribution model
- No resolution model



Combining models

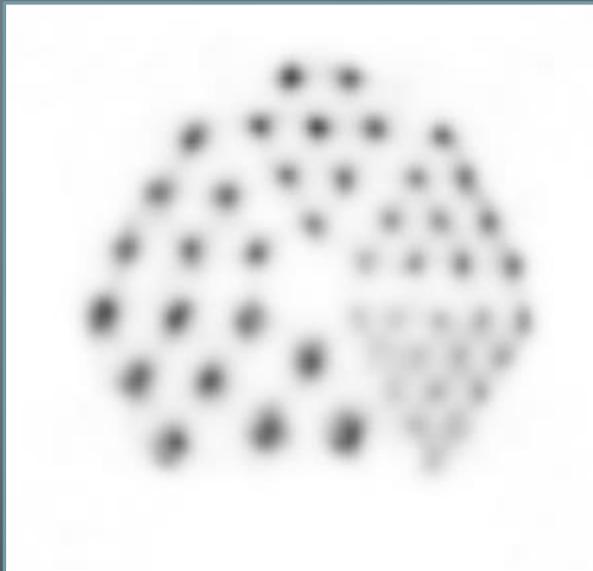
μ PET
FOV



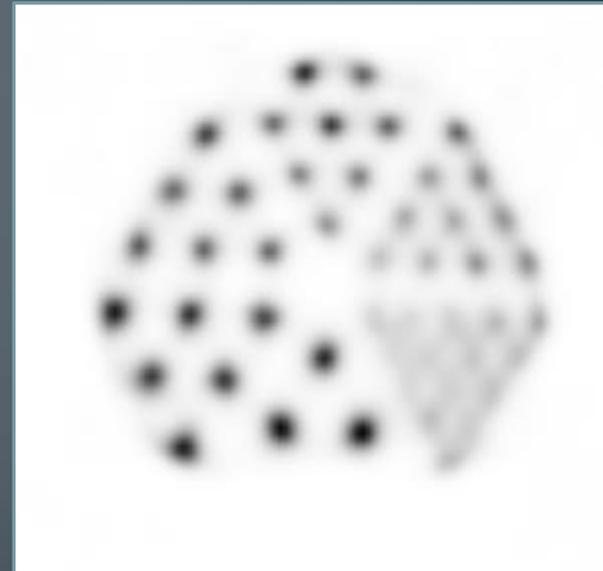
Redistribution is used for forward and backprojection

Gaussian convolution is applied before forward and after backprojection

10 iterations



Standard



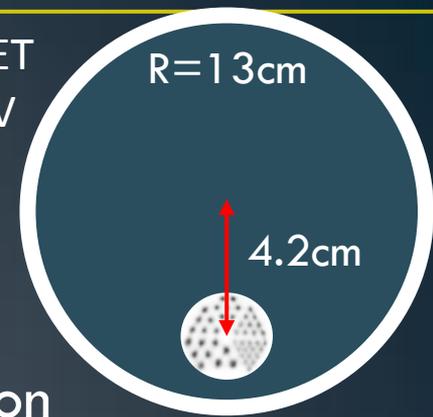
Combined models

Pixel: 0.4745 mm

Gaussian convolution

Combining models

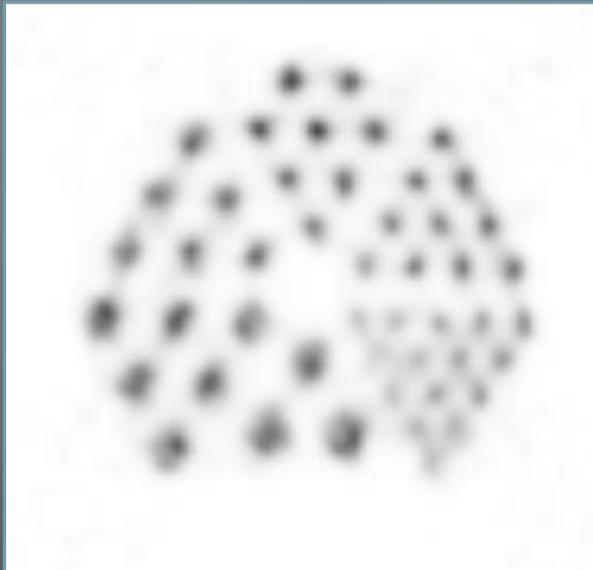
μ PET
FOV



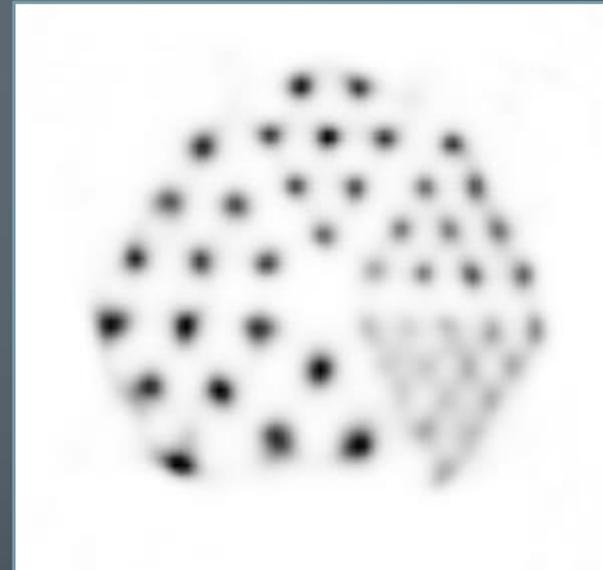
Redistribution is used for forward and backprojection

Gaussian convolution is applied before forward and after backprojection

20 iterations



Standard



Combined models

Pixel: 0.4745 mm

Gaussian convolution

Combining models

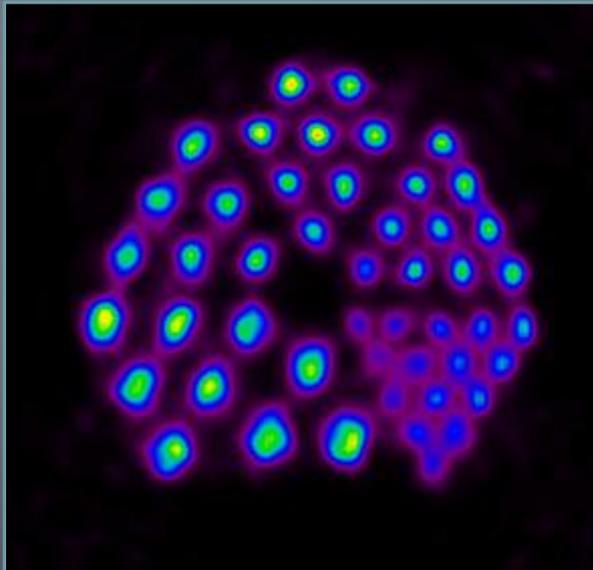
μ PET
FOV



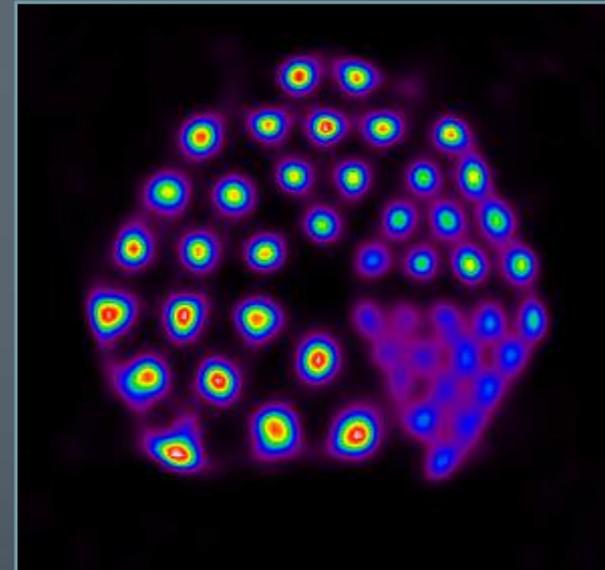
Redistribution is used for forward and backprojection

Gaussian convolution is applied before forward and after backprojection

20 iterations



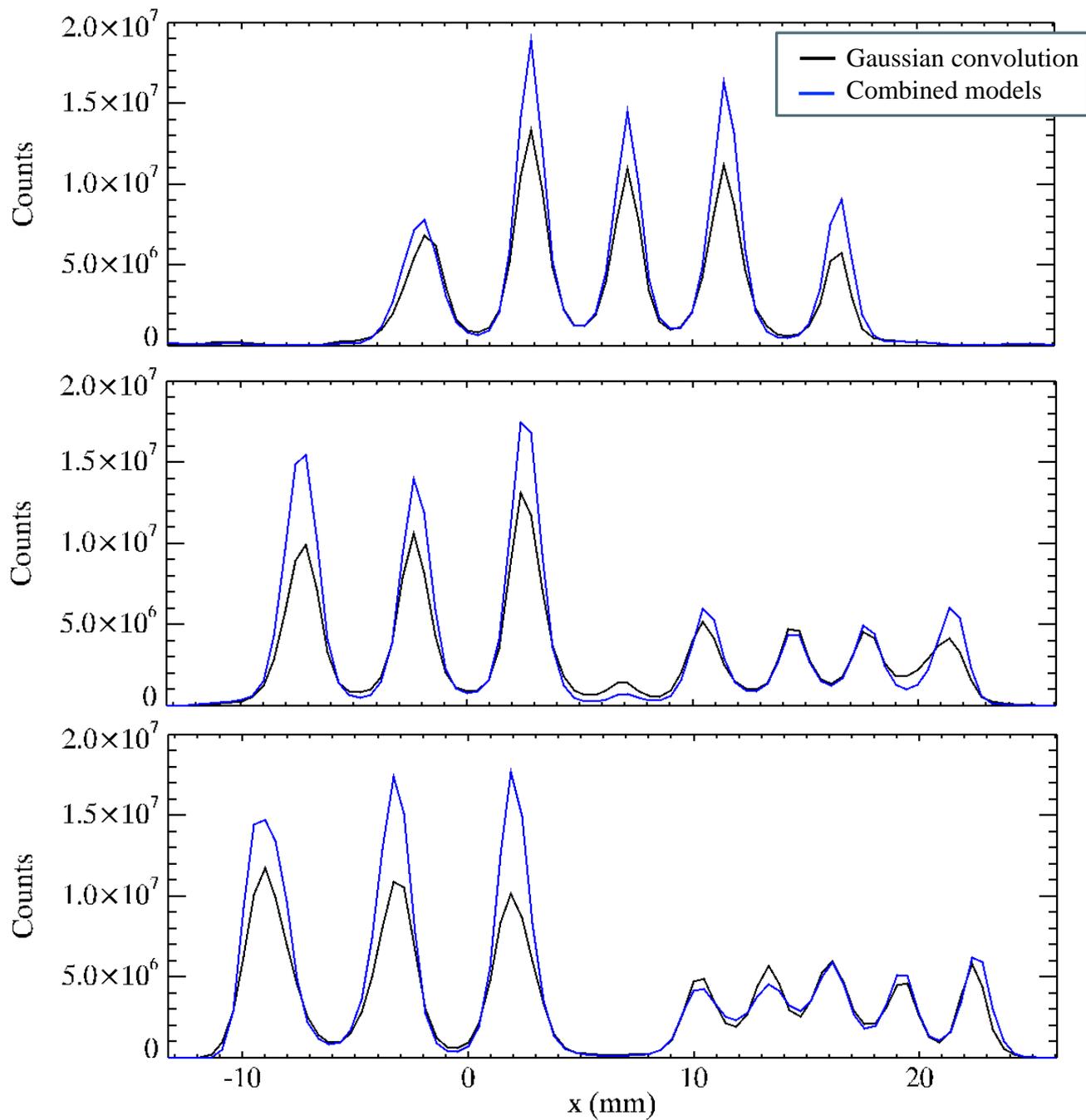
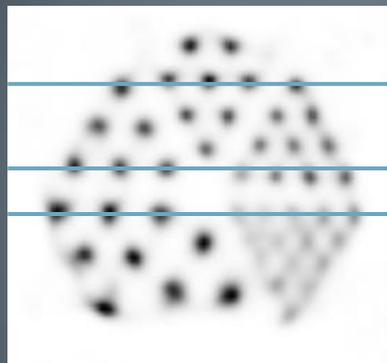
Standard



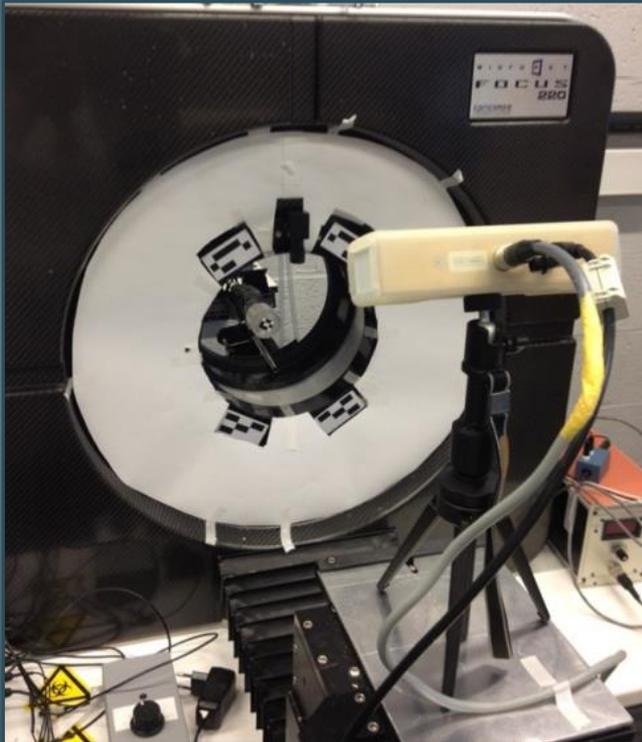
Combined models

Pixel: 0.4745 mm

Gaussian convolution



Motion correction



Brain imaging of fully awake, tube-bound rat

Motion data recorded by MicronTracker
stereo-optical camera

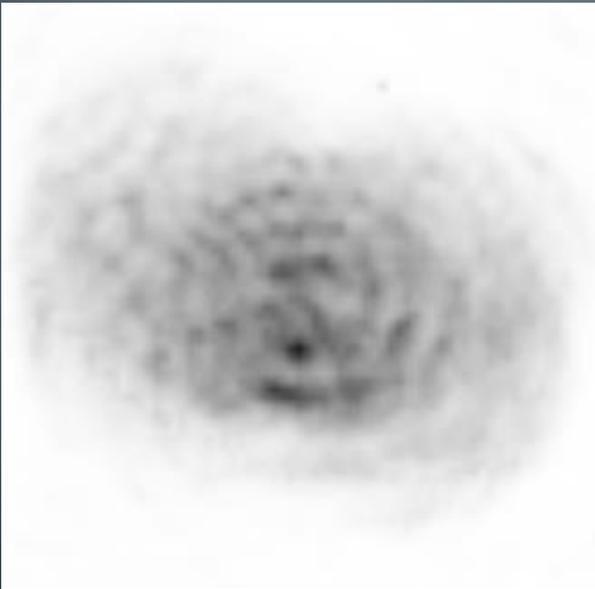
List-mode data corrected after acquisition and
before reconstruction

Motion correction

With redistribution:

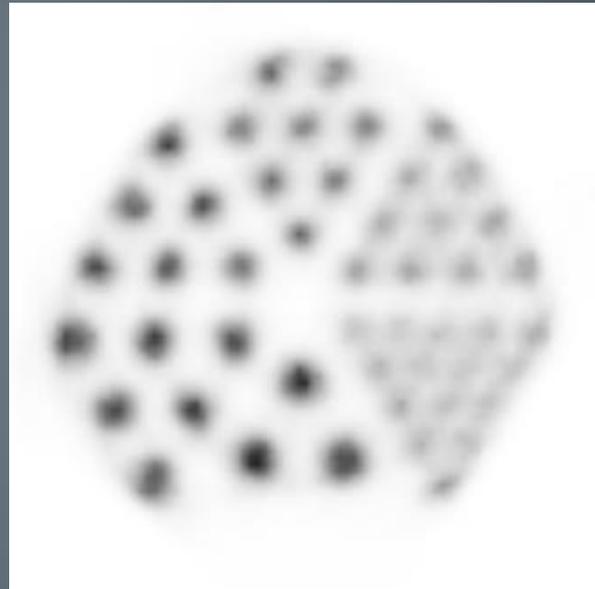
- The LORs are redistributed before being motion corrected
- Spatial variance of the model is preserved correctly

Motion correction

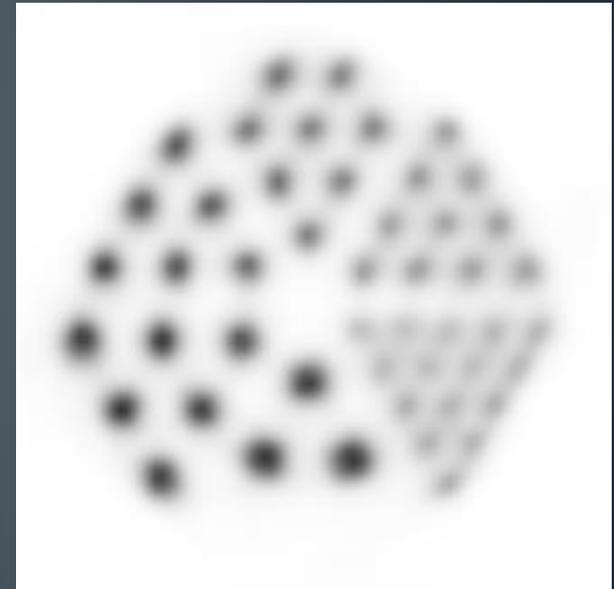


Not motion corrected

Pixel: 0.4745 mm
10 iterations, 10 subsets



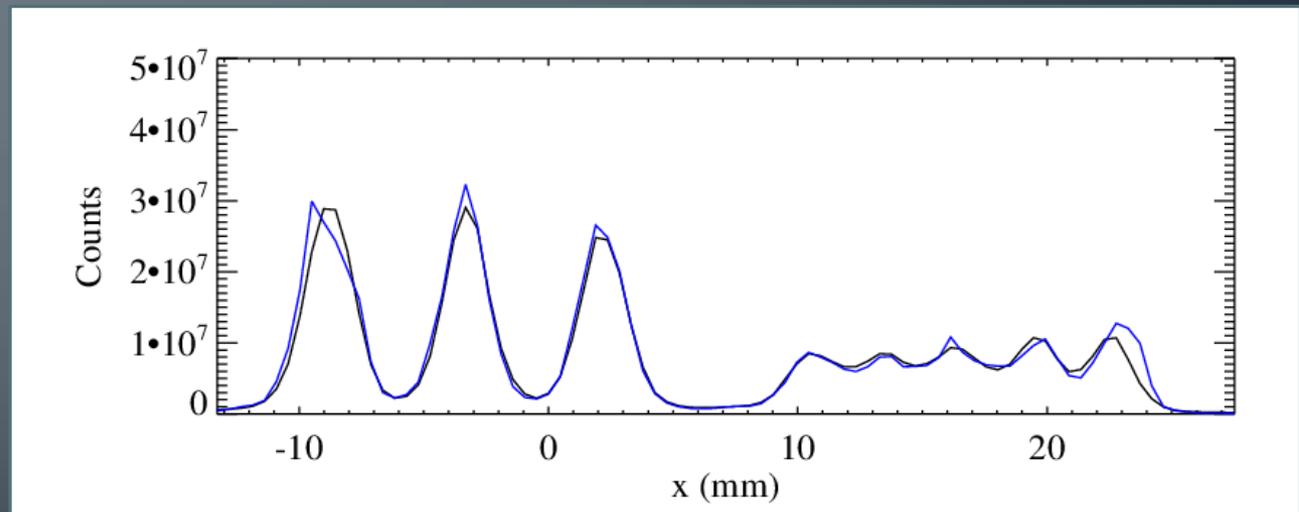
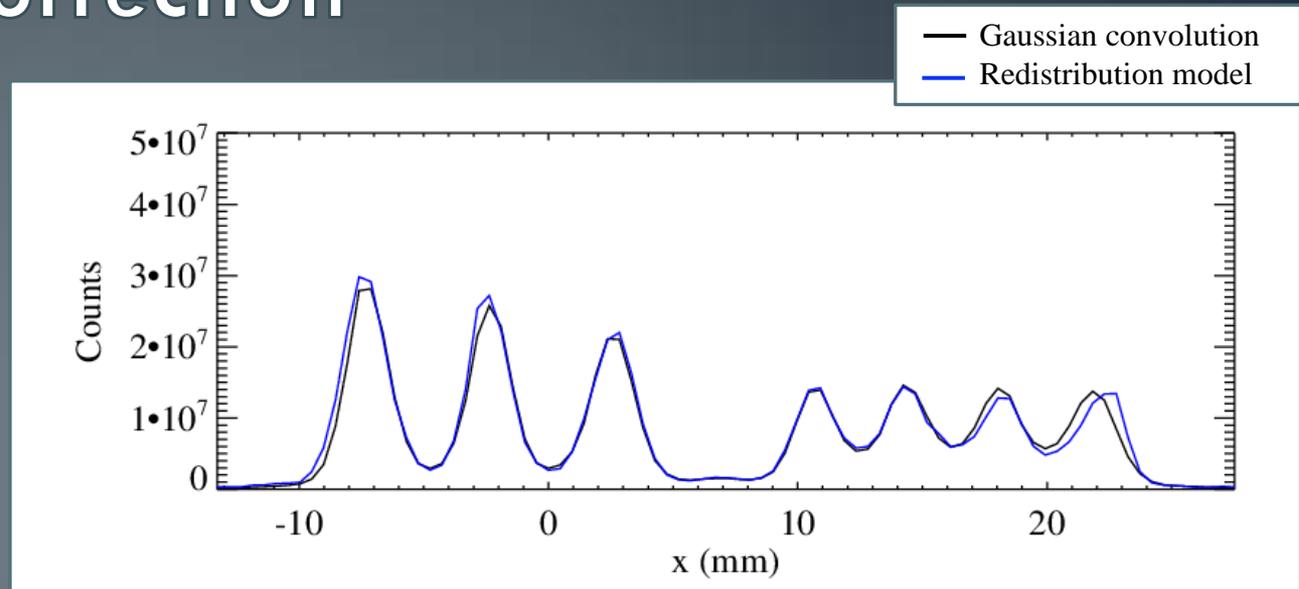
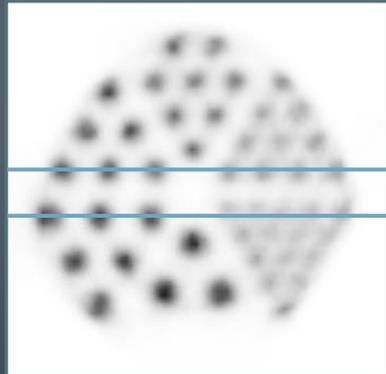
Redistribution



Gaussian convolution

Scan time: 5 minutes
Activity: 1 mCi of FDG
LORs: 130 million

Motion correction



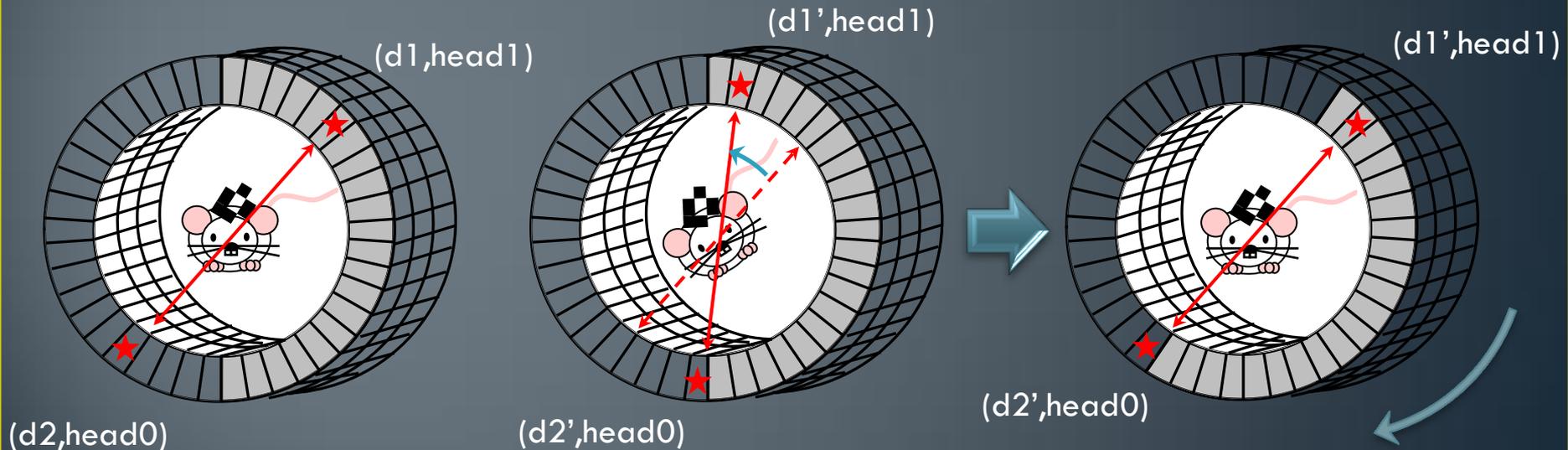
Conclusion

- A spatially variant resolution modelling technique has been introduced
- LORs are randomly redistributed accordingly to probabilistic system response functions
- System matrix is computed on-the-fly
- Easily applicable to list-mode rigid motion correction
- Shows improvement in off-centre resolution
- Noise propagation needs to be suppressed

Motion correction

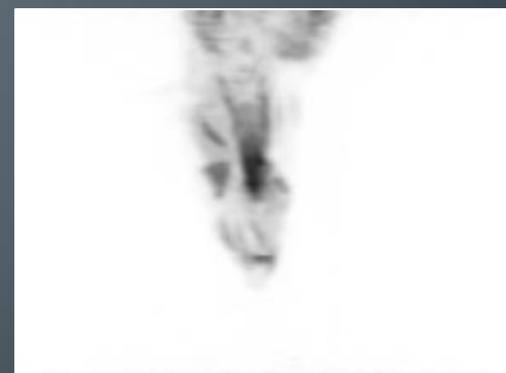
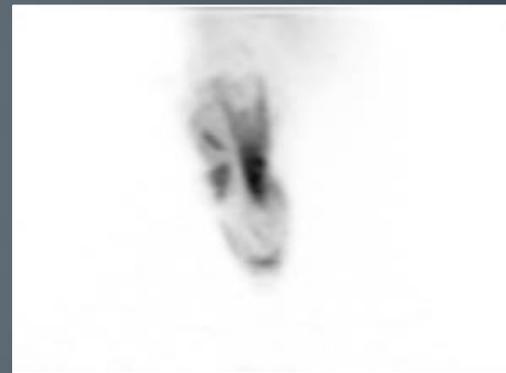
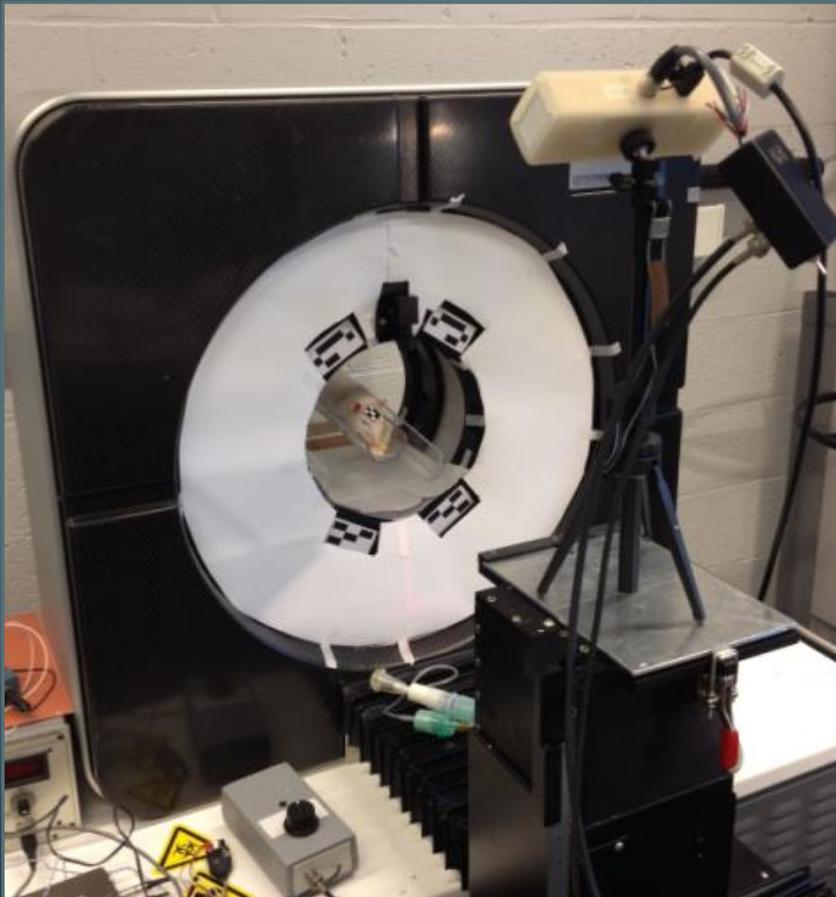
No motion

When the rat moves, assume
microPET moves rather than rat



Change of LOR orientation due to
motion estimated by MicronTracker

Motion correction



Motion scan:
15 minutes
60 min post injection

Static scan:
20 minutes
85 min post injection