

Software for Tomographic Image Reconstruction

<http://stir.sourceforge.net>
<https://github.com/UCL/STIR>

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STIR objectives

- Research enabler
- Offline image reconstruction and data manipulation
- Portable to any system with a capable C++ compiler
 - GNU C++, MS Visual Studio, Clang, Intel C++
 - Linux, Windows, MacOS, Solaris, ...
- Open Source
(L)GPL now, Apache 2.0 soon
- Use Sustainable Software Development techniques
 - For software quality
 - For training the next generation of researchers

Overview

- Using STIR
- Extending STIR
- MATLAB/Python interface
- Challenges

Overview

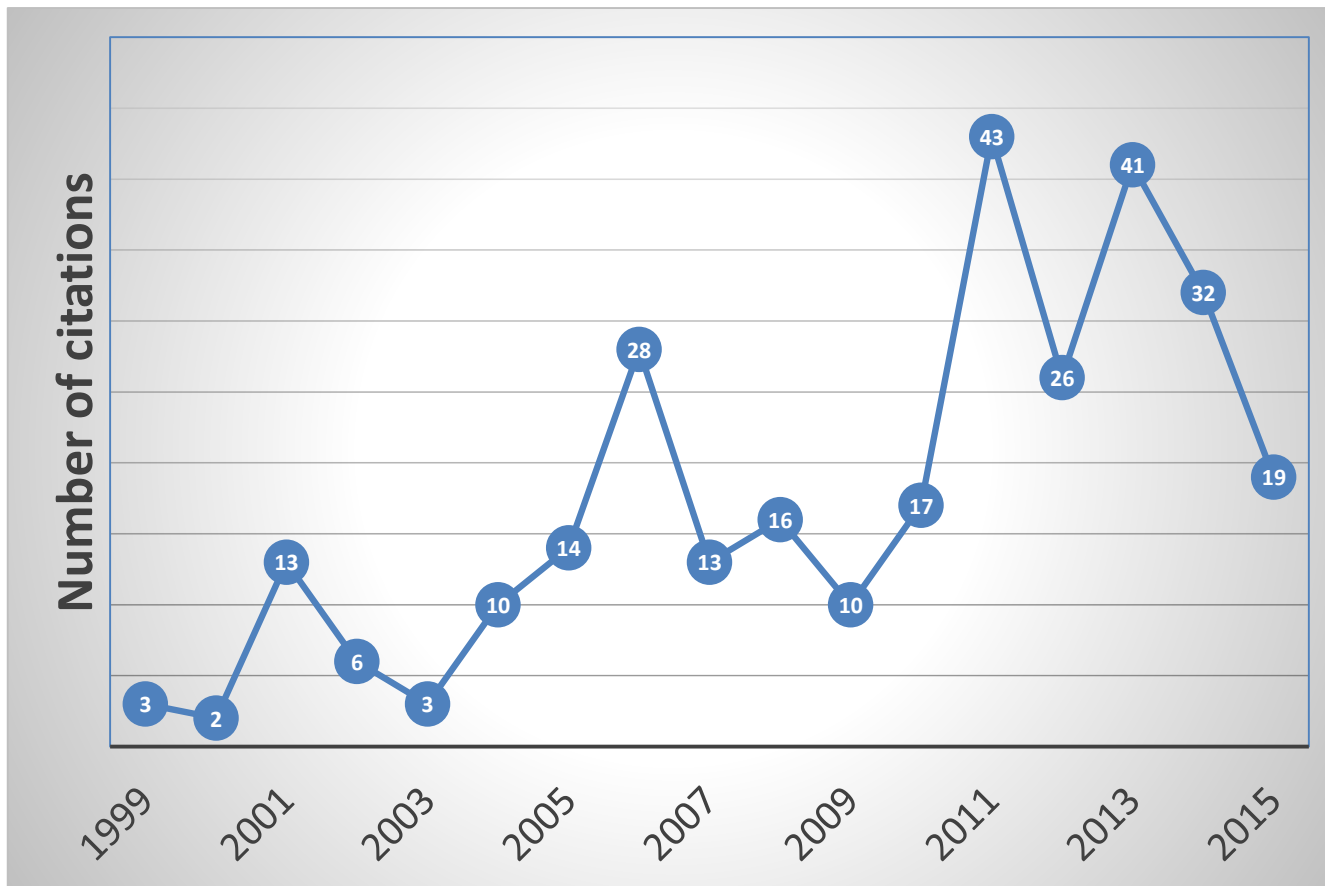
- Using STIR
 - Overview of capabilities
 - Example results
 - User perspective
 - Missing features
- Extending STIR
- MATLAB/Python interface
- Challenges

Capabilities

- PET and SPECT
- Quantitative
 - PET scatter, normalisation and randoms estimation
- Analytic and iterative 3D reconstruction algorithms
 - FBP-3DRP, FORE, OSEM, OS-MAP-OSL, OS-SPS, list-mode EM and SPS
- Pharmacokinetic modelling
 - linear models only
 - indirect and direct parametric reconstruction
- Motion correction
 - post-reconstruction and MCIR for gated data
 - LOR rebinning for rigid motion
 - no motion estimation
- Various utilities
 - data manipulation, ROI values, analytic image generation ...

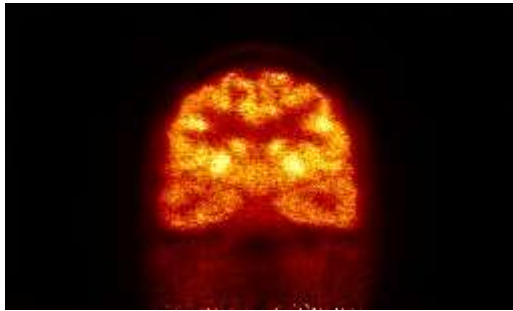
User statistics

~280 subscribers to stir-users@lists.sf.net

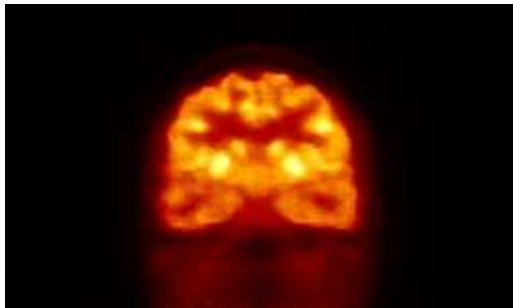


OSEM & OSL-MAP reconstruction for brain PET

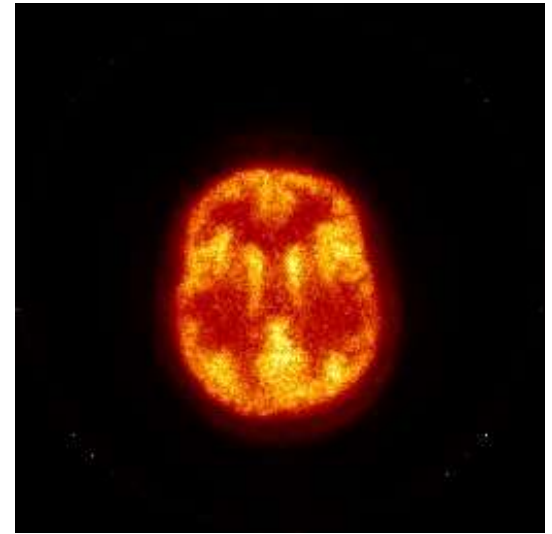
Patient data – Reconstructed Images



Coronal Image



Transverse Image

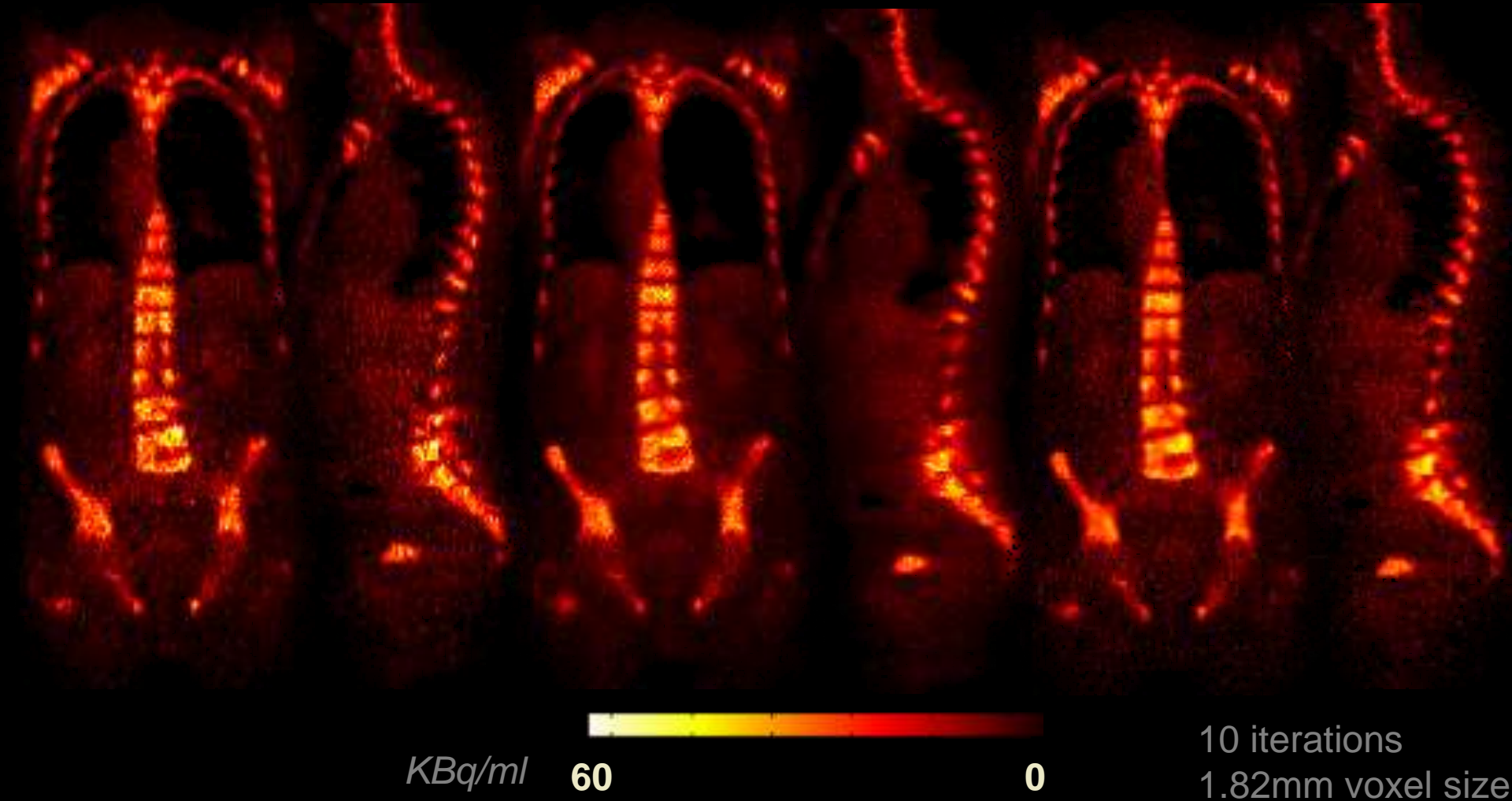


Patient (F18) acquired on GE PET/CT

OSEM FWHM 3mm

OSMAPOS L β 5

OSSPS β 0.5



KBq/ml 60

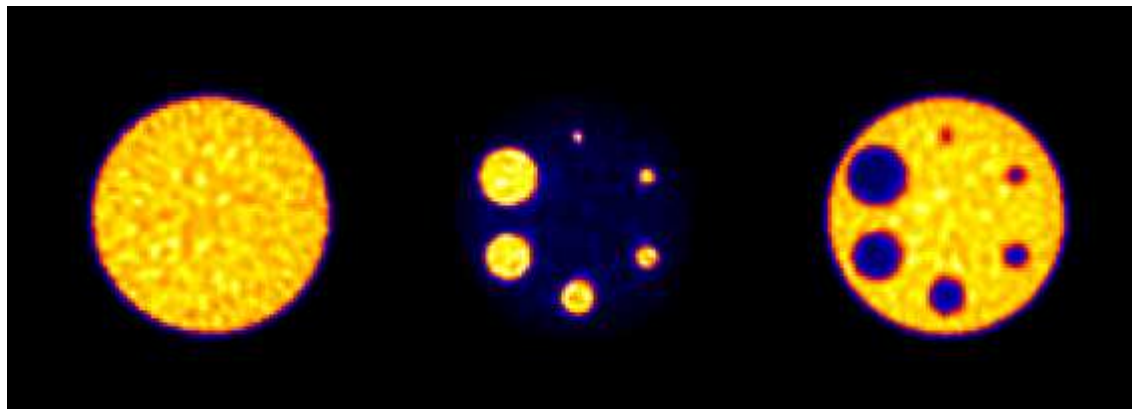
0

10 iterations
1.82mm voxel size

SPECT reconstruction

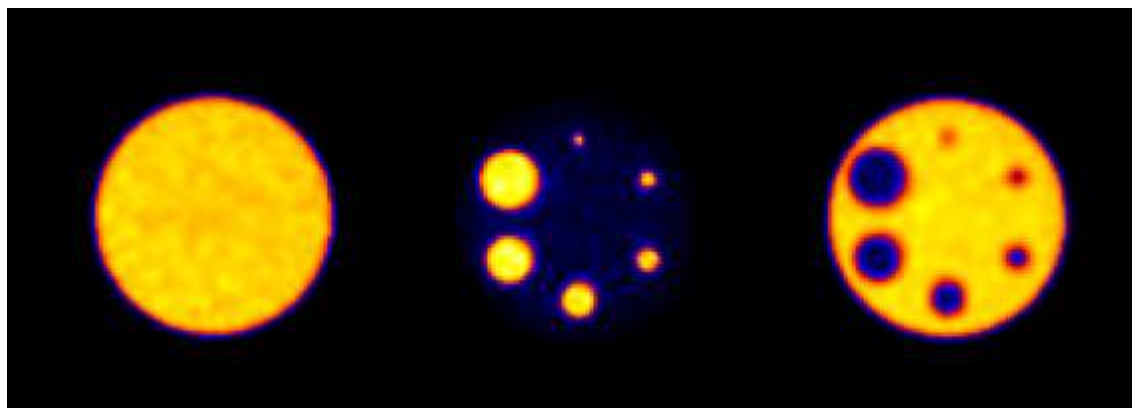
SIMULATED DATA

OSMAPOS L it 80



$C_v = 6.8\%$

OSSPS it 80



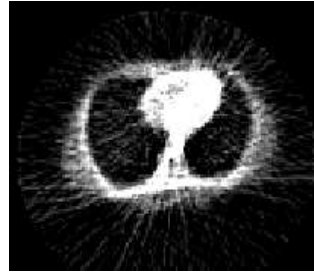
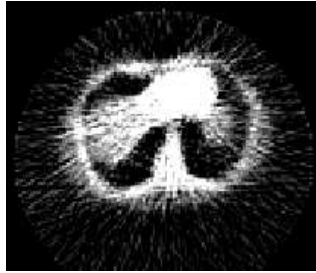
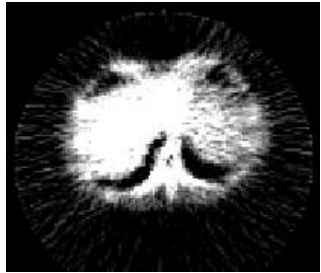
$C_v = 2.5\%$

$C_v =$ Coefficient of variation

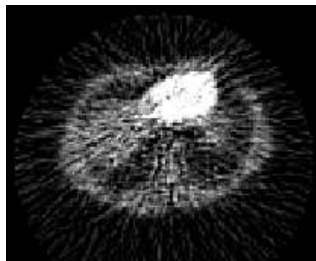
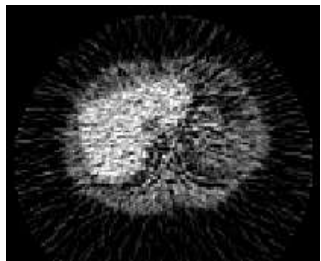


Non corrected

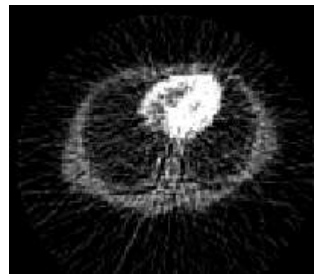
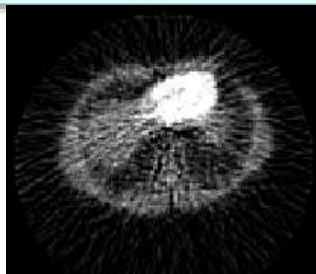
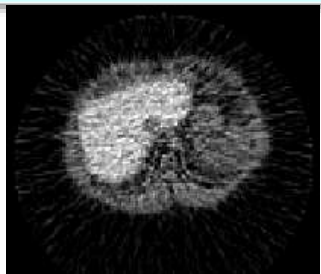
SCATTER CORRECTION EXAMPLE



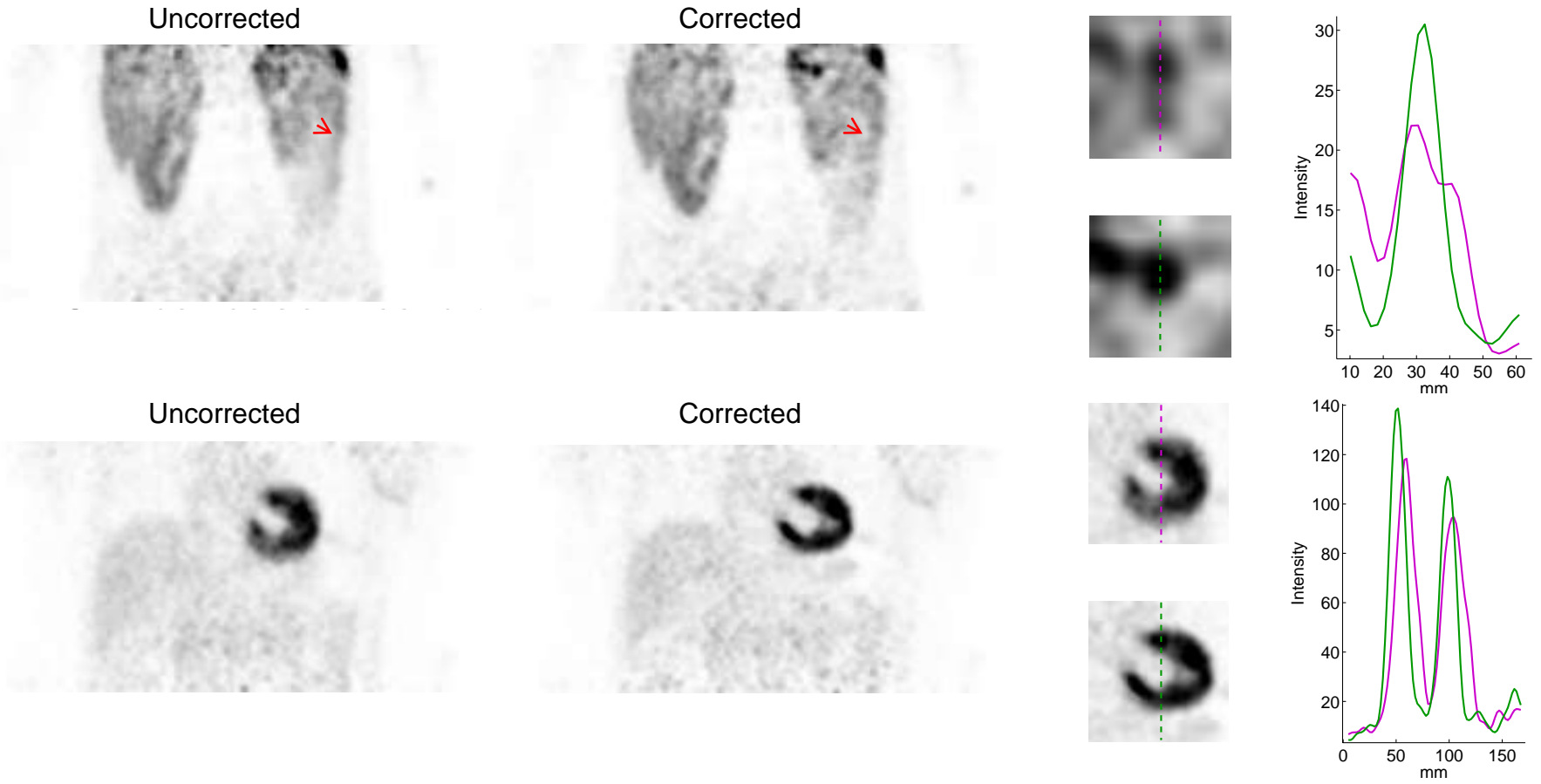
Corrected with SSS



Without Scatter



Motion-Compensated Image Reconstruction



Manber et al, JNM 2015, *Practical PET Respiratory Motion Correction in Clinical PET/MR*

Missing features

- PET
 - Reading raw data from GE, Philips (Siemens mostly ok)
 - Non-cylindrical scanners
 - TOF (WIP)
- SPECT
 - Dicom sinogram import
 - Non-parallel hole collimators
 - Scatter
- Extra reconstruction options
 - More optimisation algorithms
 - More priors (WIP)
- Closer connection with SimSET/GATE (WIP)
- GPU

Current user perspective

- Command line utilities
 - oSSPS parameterfile
- Documentation
 - PDFs (Overview, detail)
 - Wiki
 - Example parameter files
 - No easy place to start

Run-time parameter selection

```
OSSPSPParameters :=  
objective function type:= PoissonLogLikelihoodWithLinearModelForMeanAndProjData  
PoissonLogLikelihoodWithLinearModelForMeanAndProjData Parameters:=  
  input file := test.hs  
  projector pair type := Matrix  
    Projector Pair Using Matrix Parameters :=  
      Matrix type := Ray Tracing  
        Ray tracing matrix parameters :=  
          End Ray tracing matrix parameters :=  
        End Projector Pair Using Matrix Parameters :=  
  Bin Normalisation type := From ProjData  
    Bin Normalisation From ProjData :=  
      normalisation projdata filename:= norm.hs  
    End Bin Normalisation From ProjData:=  
  prior type := quadratic  
    Quadratic Prior Parameters:=  
      penalisation factor := 1  
    End Quadratic Prior Parameters:=  
  end PoissonLogLikelihoodWithLinearModelForMeanAndProjData Parameters:=  
  initial estimate:= some_image  
  output filename prefix := test  
  number of subsets:= 12  
  number of subiterations:= 24  
  relaxation parameter := 1  
  relaxation gamma:=.1  
END :=
```

Overview

- Using STIR
- Extending STIR
 - General developer's perspective
 - Example class hierarchies
- MATLAB/Python interface
- Challenges

Developer's perspective

- Object-oriented (C++) and modular
- Documented (doxygen)
- Test framework
- Extendable
 - Mechanism for extending library such that current STIR applications can use your module (e.g. projector) after recompilation
 - Mechanism for writing new applications using (original or extended) library

Code statistics

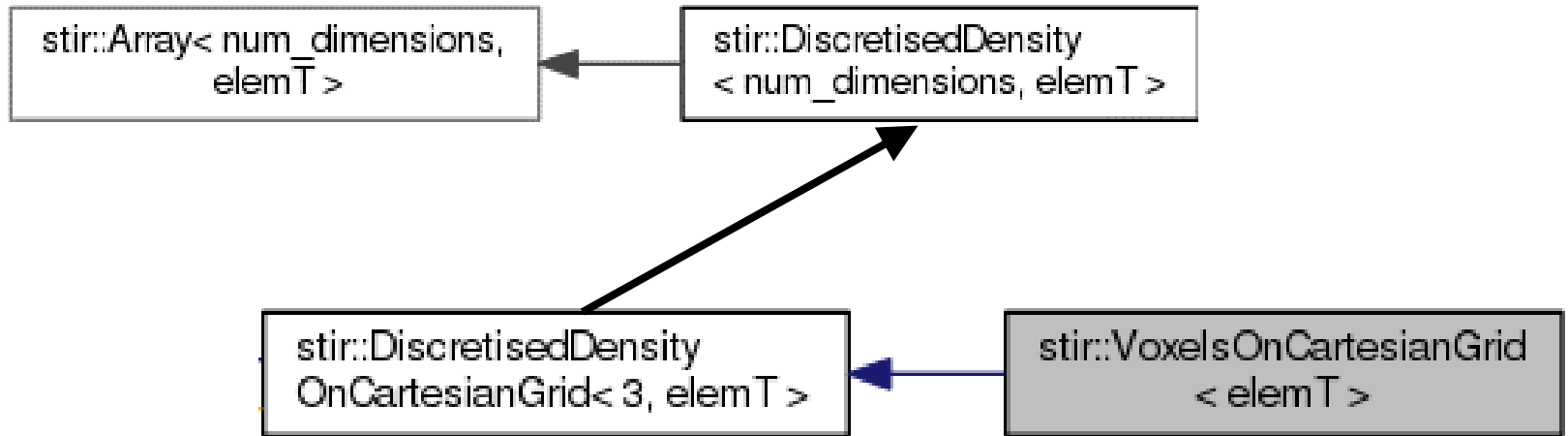
- Physical Source Lines of Code (SLOC)
= 105,886
- Total Number of Source Code Files
= 836
- Development Effort Estimate
= 26.74 Person-Years
(Basic COCOMO model)

generated using David A. Wheeler's 'SLOCCount'

Images

Discretised representations of a “density”, e.g.

$$f(\hat{x}) = \sum_{ijk} \lambda_{ijk} b_{ijk}(\hat{x})$$

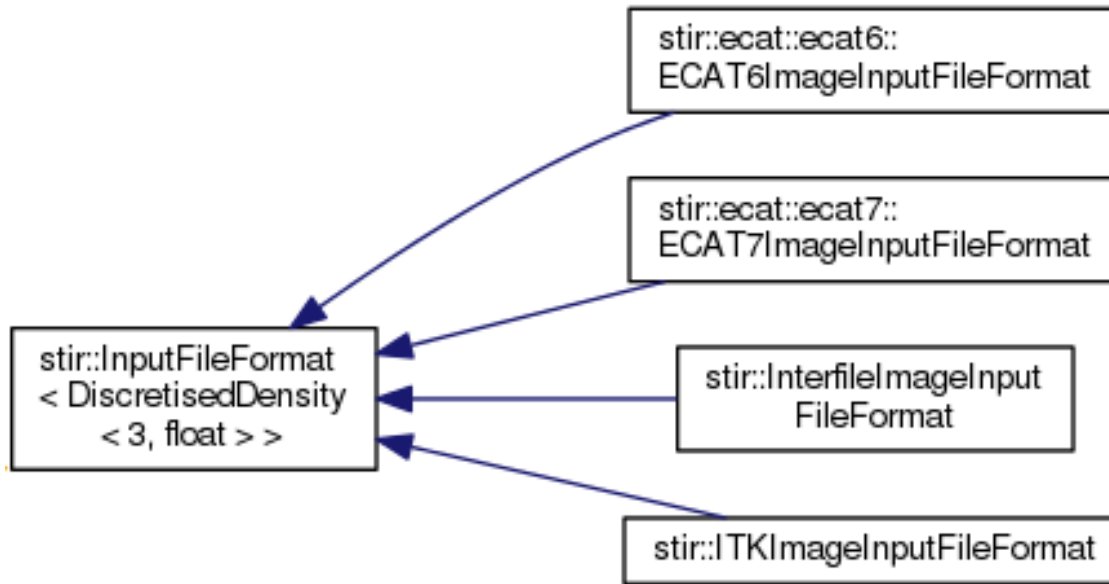


```
float sx = image.get_voxel_size().x();
```

```
auto voxel_location =  
image.get_physical_coordinates_for_indices(make_coord(i, j, k));
```

```
image[i][j][k] = 4;  
float value = image[make_coord(i, j, k)];
```

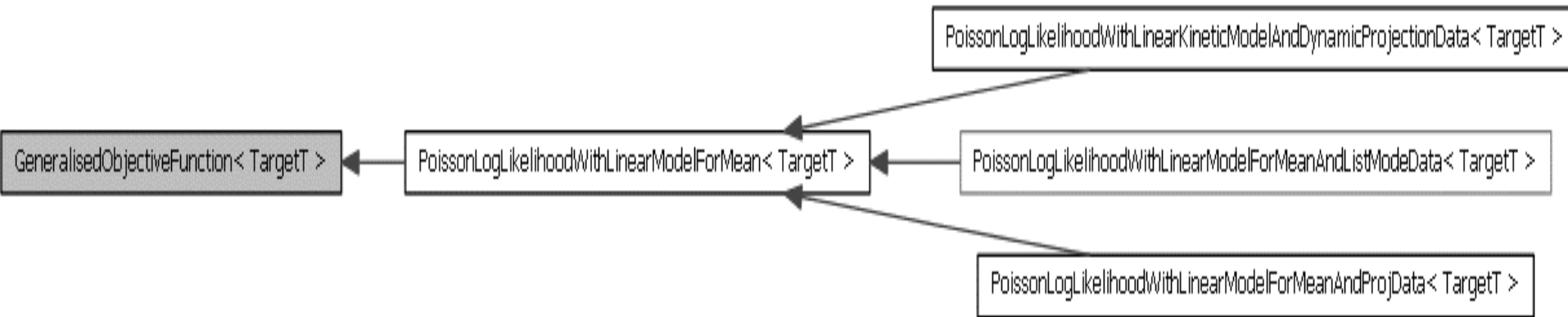
IO: pluggable factories



```
typedef DiscretisedDensity<3,float> ImageType;  
auto density_sptr(read_from_file<ImageType>(filename));
```

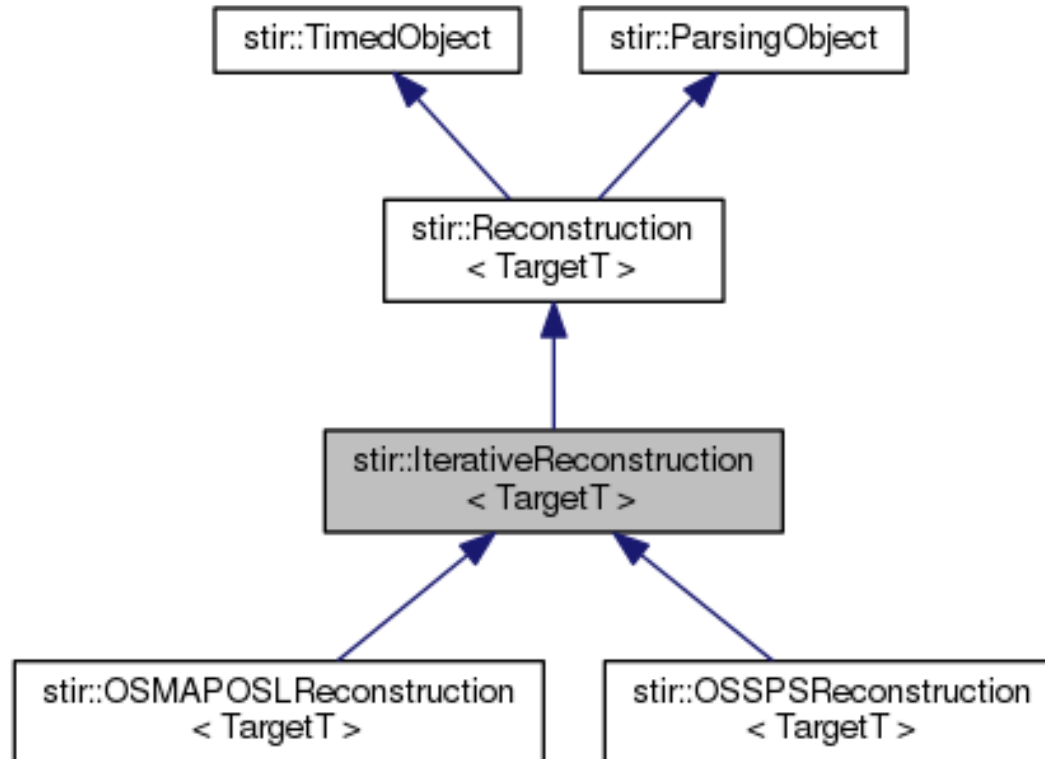
Similar for dynamic data, list mode data, ...

Objective functions



```
double value =  
    objf.compute_objective_function (image, subset_num);  
objf.compute_sub_gradient (gradient, image, subset_num);
```

Reconstruction algorithms

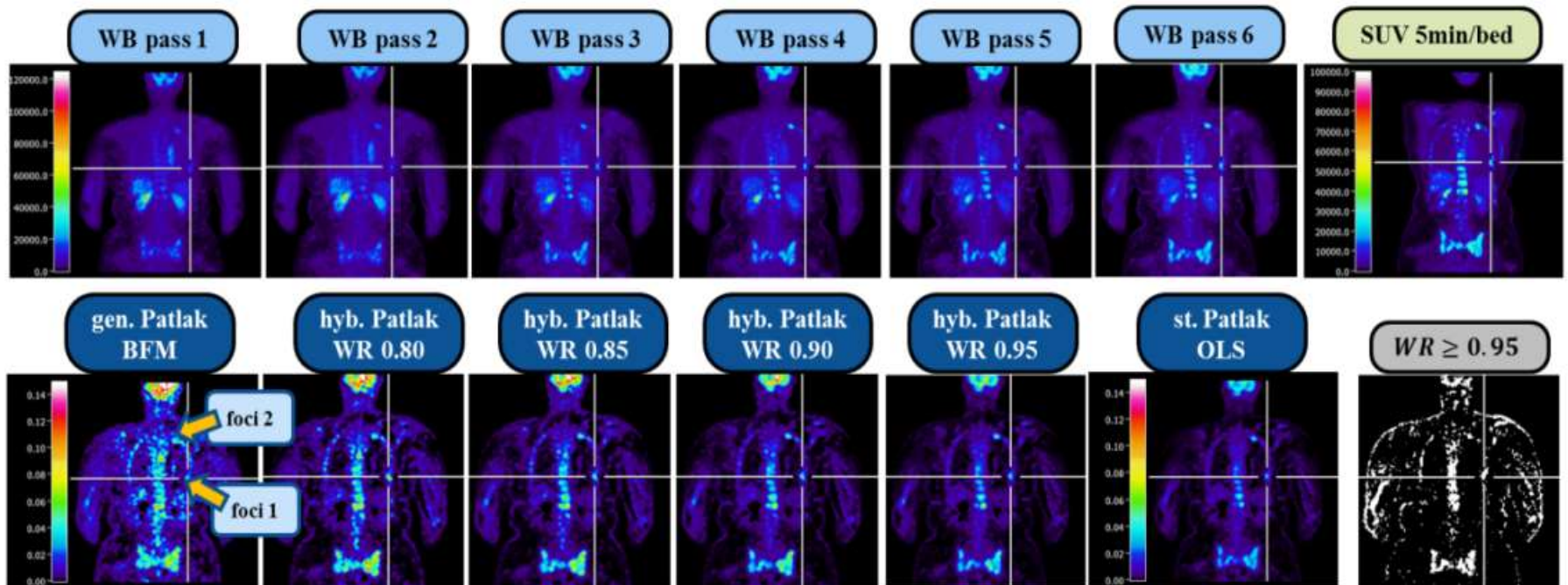


```
OSMAPOSLReconstruction<ImageType> recon(parameter_file);  
recon.set_num_subiterations(5);  
// reconstruct from initial image  
recon.reconstruct(image);
```

Generalized whole-body Patlak PET

generalized Patlak model equation

$$\frac{C(t_k)}{C_P(t_k)} = K_i \frac{\int_0^{t_k} e^{-k_{loss}(t_k-\tau)} C_P(\tau) d\tau}{C_P(t_k)} + V, \quad t_k > t^*$$



Overview

- Using STIR
- Extending STIR
- MATLAB/Python interface
 - How?
 - Examples
- Challenges

STIR and MATLAB/Python

- Interface constructed via SWIG

The logo for SWIG, consisting of the letters 'S', 'W', 'I', and 'G' in a white, monospace font, each inside a small black square, which are then arranged in a larger black square.

Simplified Wrapper and Interface Generator

- Parses “interface” text file and C++ headers
 - Generates MATLAB/Python/C++
 - Compile to generate library
- Object-oriented MATLAB/Python
(close to C++, but no templates, pointers etc)
- Work-in-Progress
 - SWIG-MATLAB is under development.

Python: objective function computation

```
## initialise reconstruction object via a parameter file
recon=stir.OSMAPOSLReconstruction3DFloat('recon_demo_OSEM.par');

## construct image related to the data to reconstruct
projdata=stir.ProjData.read_from_file('input_sinogram.hs');
target=stir.FloatVoxelsOnCartesianGrid(projdata.get_proj_data_info());

## set-up objective function
recon.set_up(target);
% get corresponding objective function
poissonobj=recon.get_objective_function();

## compute gradient of objective function
# put some data in the image
target.fill(1);
# create an image to store the gradient
gradient=target.get_empty_copy();
poissonobj.compute_sub_gradient(gradient,target)

## display
gradientdata=stirextra.to_numpy(gradient);
pylab.figure();
pylab.imshow(gradientdata[10,:,:])
pylab.show()
```

MATLAB: objective function computation

```
%% initialise reconstruction object via a parameter file
recon=stir.OSMAPOSLReconstruction3DFloat('recon_demo_OSEM.par');

%% construct image related to the data to reconstruct
projdata=stir.ProjData.read_from_file('input_sinogram.hs');
target=stir.FloatVoxelsOnCartesianGrid(projdata.get_proj_data_info());

%% set-up objective function
recon.set_up(target);
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%% compute gradient of objective function
% put some data in the image
target.fill(1);
% create an image to store the gradient
gradient=target.get_empty_copy();
poissonobj.compute_sub_gradient(gradient,target)

%% display
gradientdata=gradient.to_matlab();
figure;
imshow(gradientdata(:,:,10),[])
```

Overview

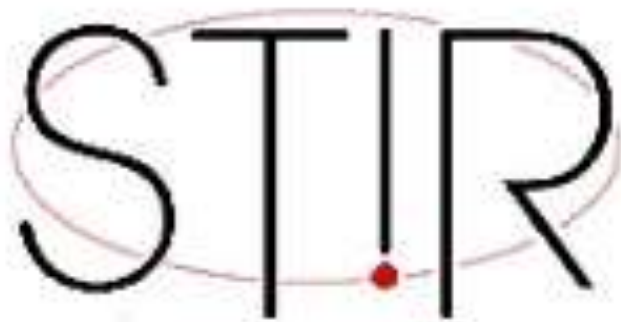
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Challenges (I)

- Lots of functionality
 - Good software design is crucial
 - Modular/flexible involves overhead
- Large code-base
 - Good software design is crucial
 - Not enough documentation
 - Too much documentation
- Rapid development in software/hardware

Challenges (II)

- Manage user expectations
- Foster user involvement
 - Lots of questions on the mailing list
 - Current group of “developers” is small
 - Hopefully will increase with Python/MATLAB capabilities
- Needs time investment



Main publication:

Thielemans, Tsoumpas, *et al* (2012) STIR: Software for Tomographic Image Reconstruction Release 2, *Physics in Medicine and Biology*, 57(4):867-83.

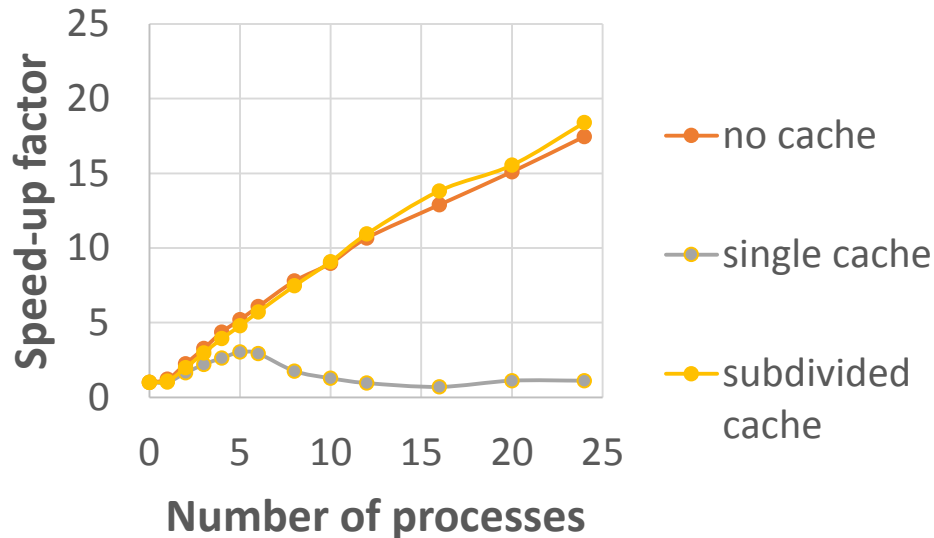




Parallelisation

- Cluster: MPI
- Multi-threading: OpenMP

Dual-Opteron system



**Wall-clock times
per MLEM iteration**
Siemens mMR data (span 11)

No threading	315s
20 threads	20s

Future contributions

- 4D Generalised Patlak for multi-bed position data
Nicolas Karakatsanis, Arman Rahmim, Habib Zaidi
- List-mode reconstruction fixes
Nikos Efthimiou, Charalampos Tsoumpas
- TOF
Nikos Efthimiou, Charalampos Tsoumpas
- Non-cylindrical scanners => cylindrical
Jannis Fischer
- Support for GE PET-MR