



Progress in Hard-Field Industrial Tomography

Packard Room 101, Engineering bldg.
Stanford university

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Outline

- Introductions: IEEE Sensors Council, The University of Manchester
- 5 minutes' excursion in Hard-Field Tomography
- Applications of Tomography sensing and imaging in Industry
- Challenges and solutions in non-medical applications:
 - wavelength-sensitive modalities: IR, THz
 - path integrals: kinds of image contrast, T^0 -mapping
 - insufficient data: sinogram recovery from limited data
-

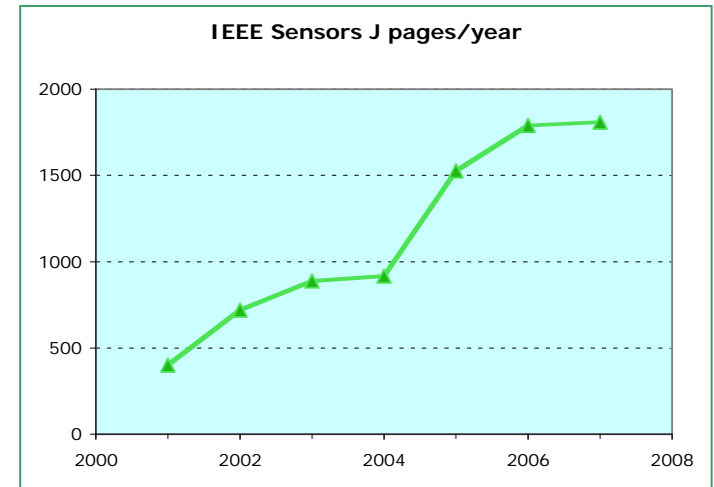
DL sponsored by the IEEE Sensors Council



Celebrating 125 Years
of Engineering the Future



QuickTime™ and a
TIFF (LZW) decompressor
are needed to see this picture.



Conferences: IEEE Sensors xx

2002	2003	2004	2005	2006	2007	2008	2009	2010	2011
Orlando Florida	Toronto Canada	Vienna Austria	Irvine Calif.	Daegu Korea	Atlanta Georgia	Lecce Italy	Christchurch N Zealand	Hawaii USA	Limerick Ireland

The (new) University of Manchester

MANCHESTER
1824

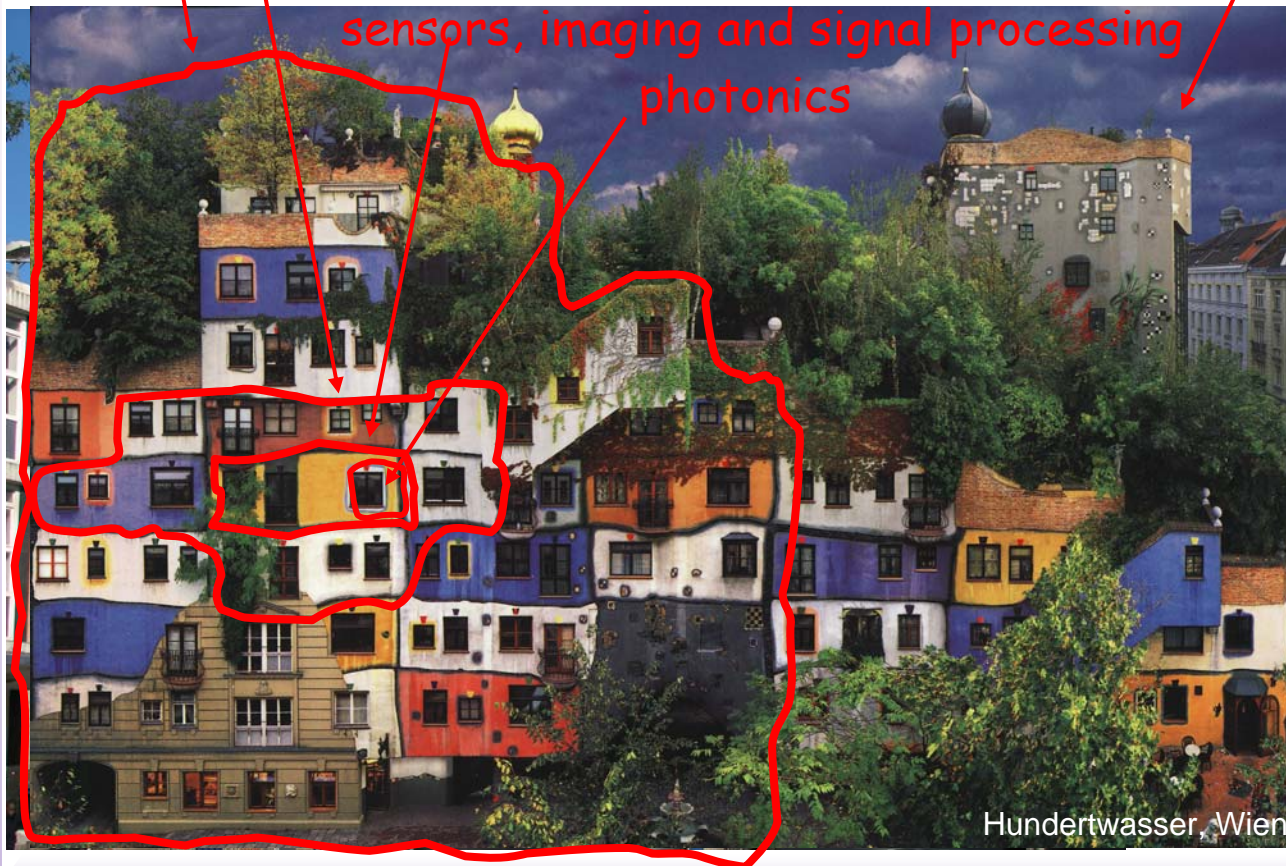
The University of Manchester

faculty of eng. & phys. sci.

president's tower

school of electric. & electron. eng.

sensors, imaging and signal processing
photonics



- interdisciplinarity
- research-driven
- 2015 strategy

Parallel structures: Institutes

The Photon Science Institute



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- **5 minutes' excursion in Hard-Field Tomography**
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Tomography: To see where you can't reach

From Greek: τομή - cut
 γραφός - image

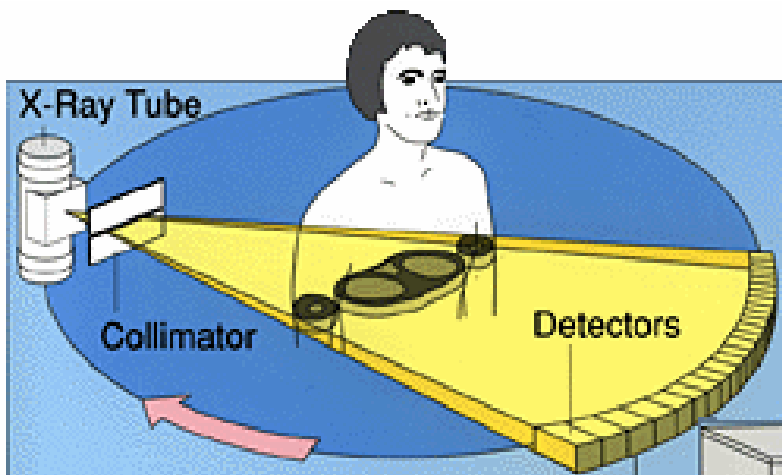
The name reflects the fact that with carefully chosen measurements at the periphery of an object, one can produce without intrusion an image of inaccessible cross-sections.

How to extract images from measurements taken with a particular strategy?

Soft-field vs Hard-field Tomography

“Hard” field:

The EM field propagates along a straight line through the volume, i.e. the measurement at the volume surface depends on the values of the measured quantity only along the probed path.



Examples:

X-ray Tomography,
Positron Emission Tomography,
Microwave Tomography
Optical Tomography

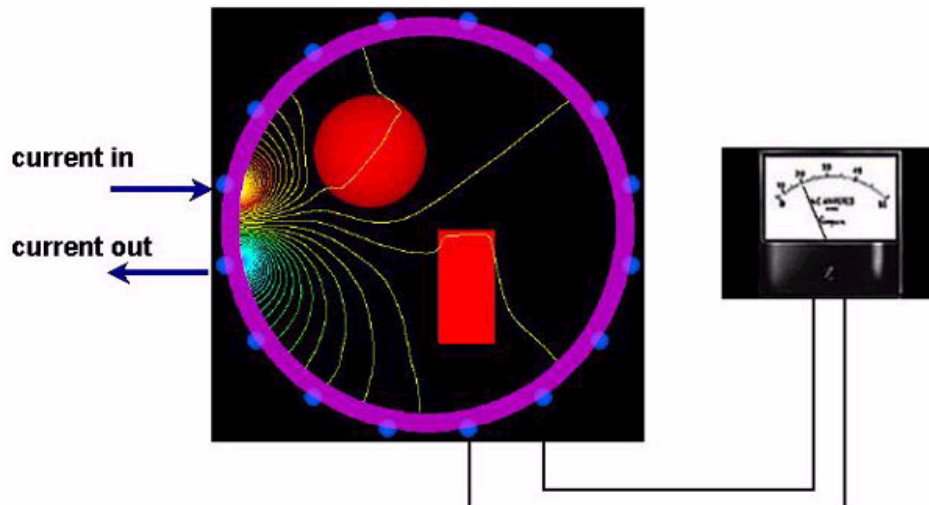
.....

typically **High-Frequency** modalities.

Soft-field vs Hard-field Tomography

“Soft” field:

The EM field propagates across the whole probed volume, i.e. the measurement at the volume surface depends on the values of the measured quantity everywhere in the volume.



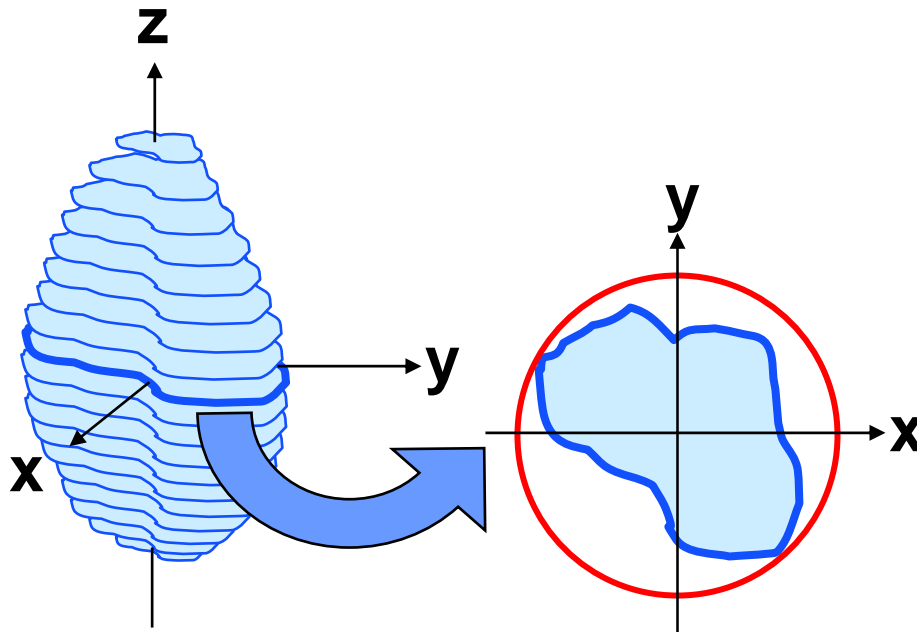
Examples:

Electrical Capacitance Tomography,
Electrical Impedance Tomography,
.....

typically **Low-Frequency** modalities.

3D stacks of 2D slices

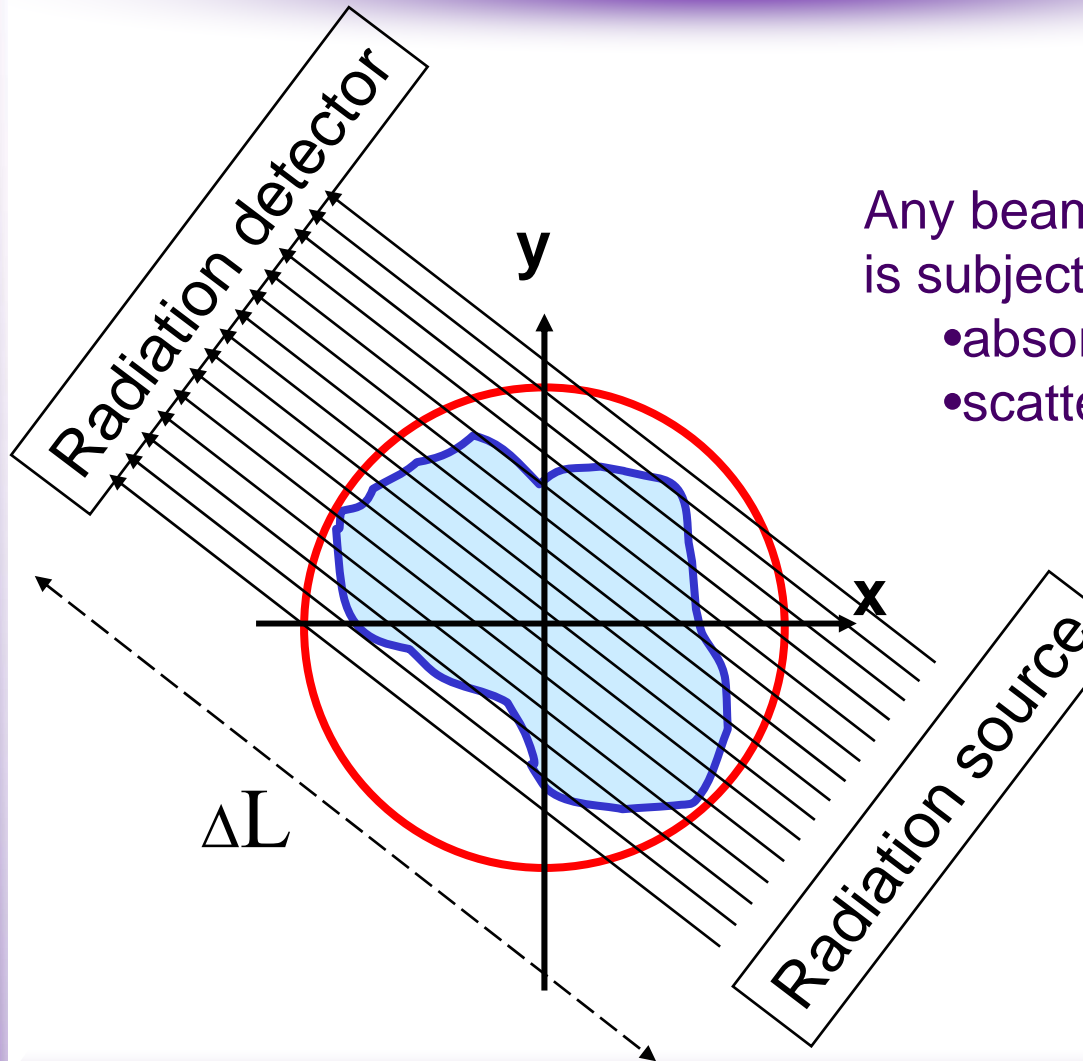
The object is 'sliced' along one of the axes (z)
(If the slices are infinitesimally thin, we have a slice for each z)



QuickTime™ and a
YUV420 codec decompressor
are needed to see this picture.

If we reconstruct each slice of the object we can reconstruct
the whole object by stacking of slices

X-ray CT: the modality



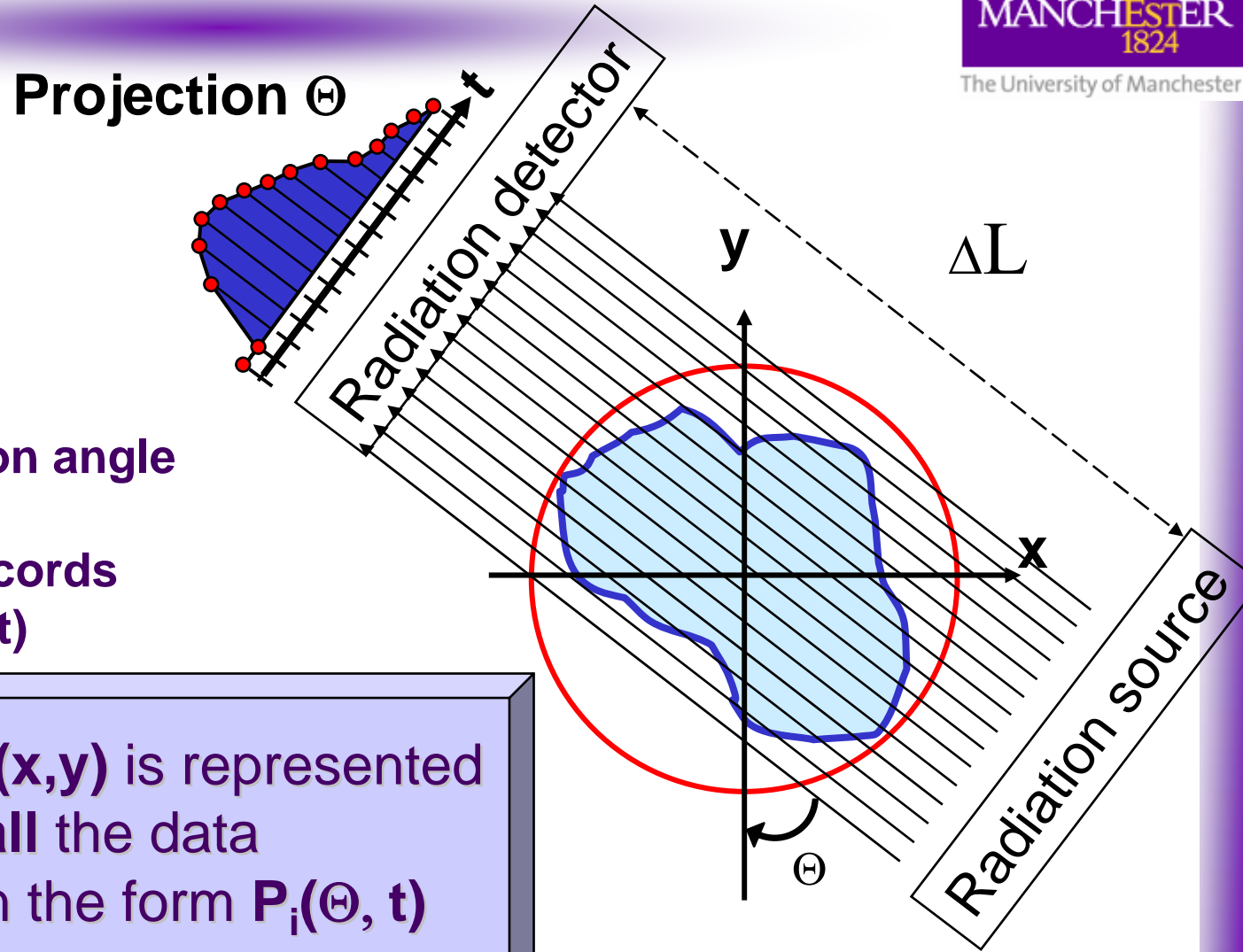
Any beam passing through the object is subject to attenuation:

- absorption
- scatter

$$\frac{N_{\text{source}} - N_{\text{detector}}}{N_{\text{detector}}} = \mu \cdot \Delta L$$

$$N_d = N_s e^{-\int_{\text{path}} \mu(L) \cdot dL}$$

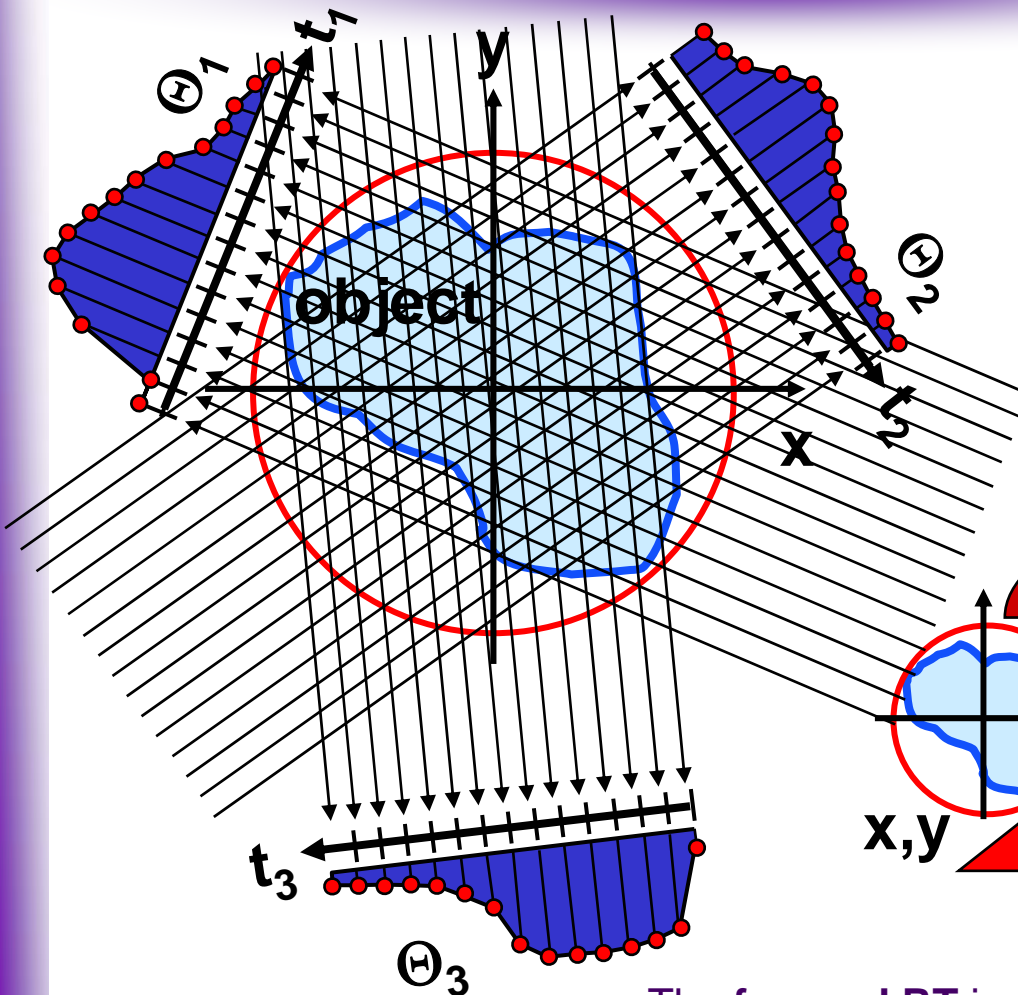
X-ray CT: the projection



For each projection angle $\theta_1, \theta_2, \dots, \theta_n$ the tomograph records projections $P_i(\theta, t)$

The object $F(x,y)$ is represented by **all** the data acquired in the form $P_i(\theta, t)$

The Radon Transform



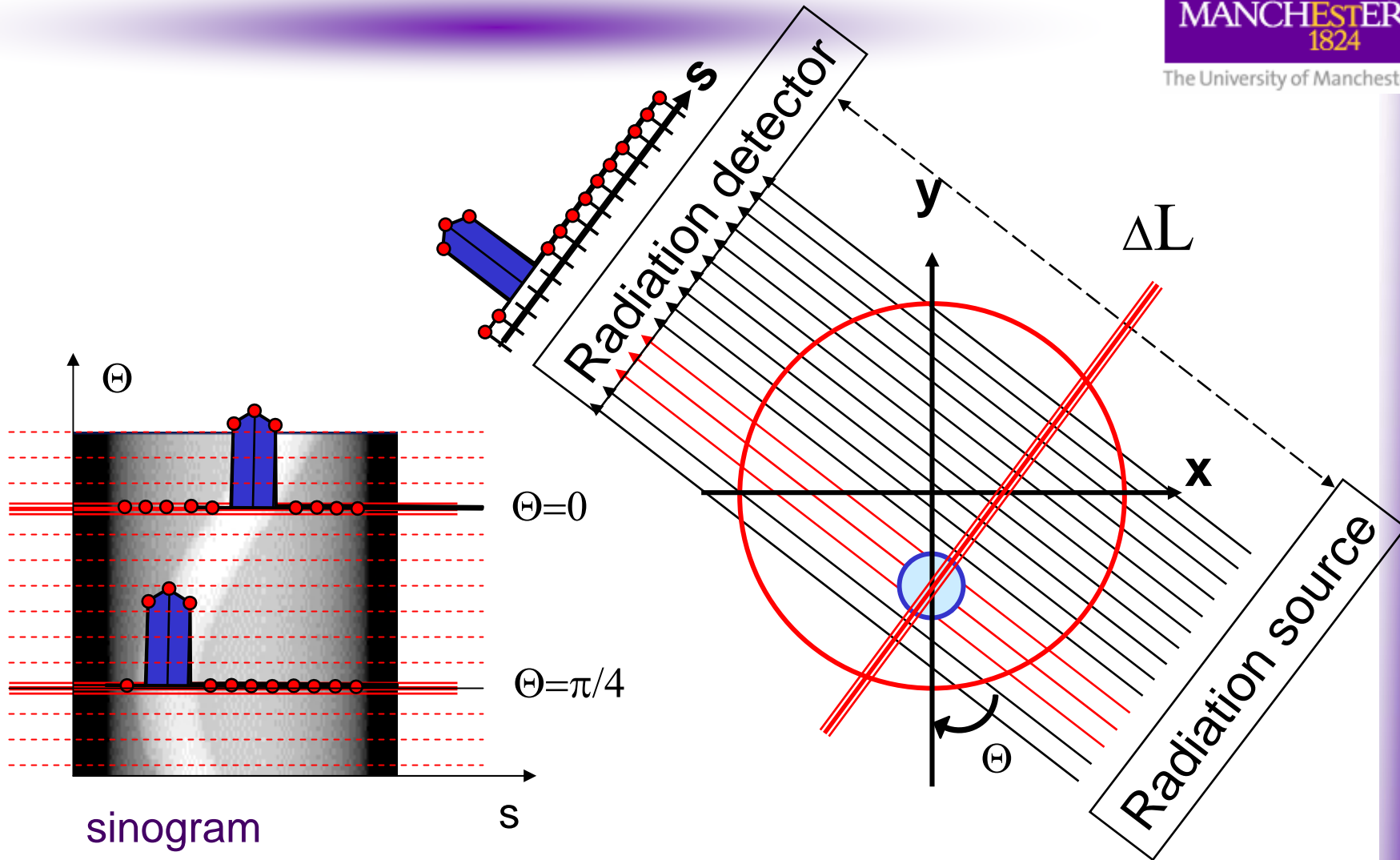
Experimental requirements:

- as many parallel beams as possible
- as many projections as possible



The **forward** RT is performed experimentally (**measurement**)
The **inverse** RT is performed mathematically (**reconstruction**)

Sinogram



Inverse problem of Tomography

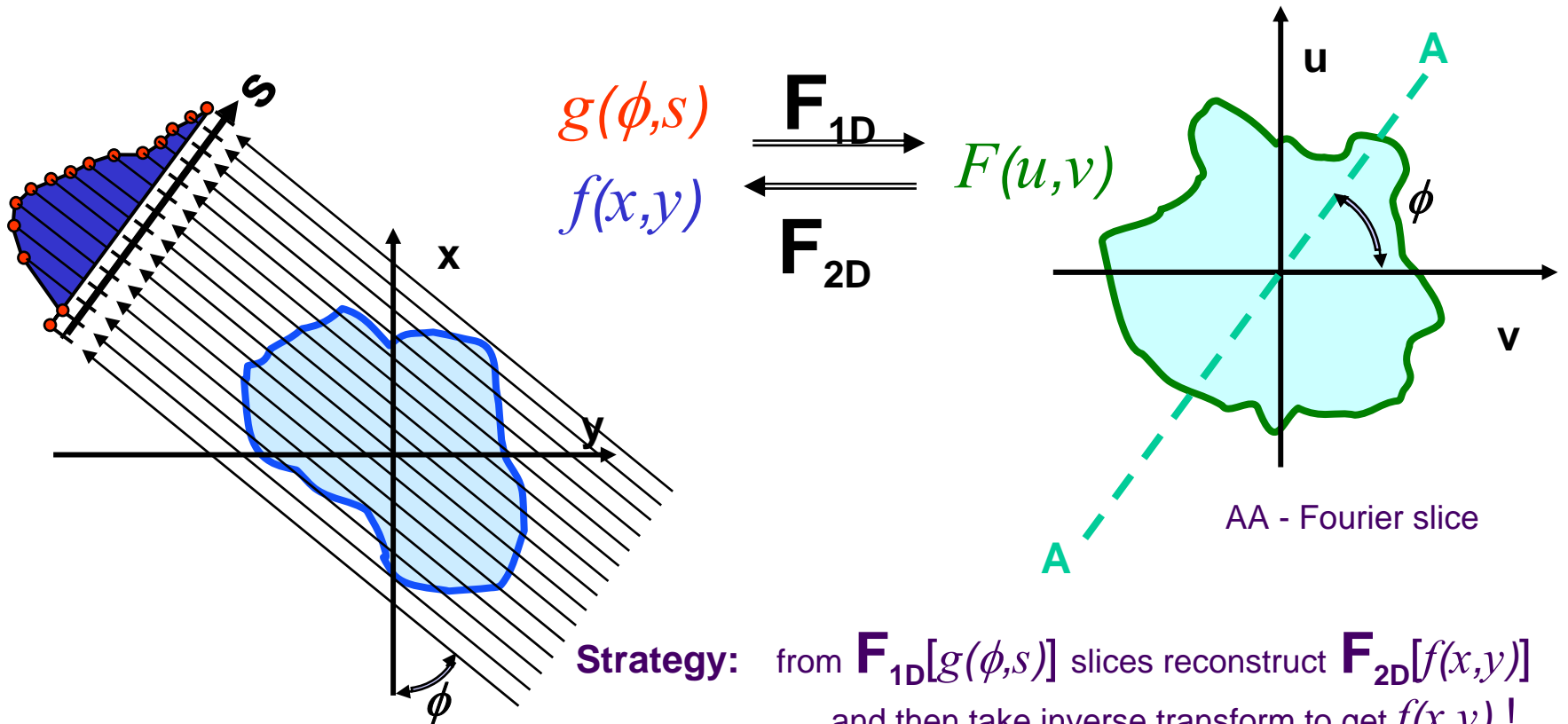
The basic problem of CT is:

***Given a set of 1D projections
and the angles at which these projections were taken, to
reconstruct the 2-D image.***

There are analytical and non-analytical (iterative) methods of solving the inverse problem, which is ill-posed and ill-conditioned.

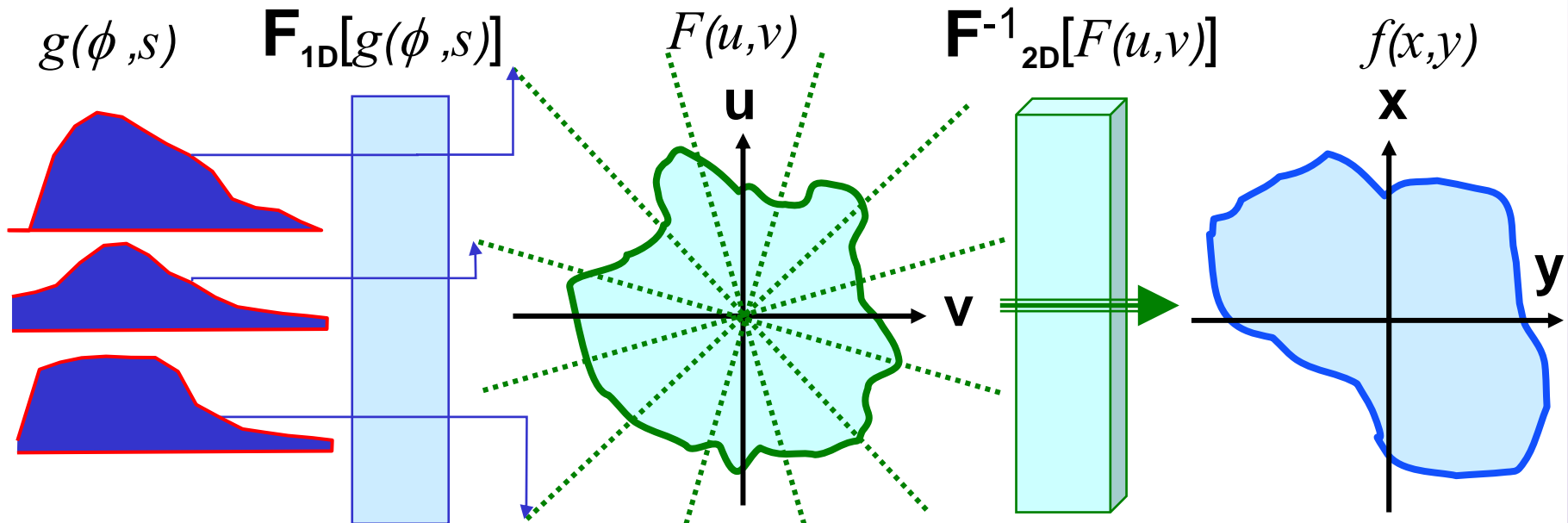
Inverse Radon Transform (iRT)

The 1D FT of the projection function $g(\phi, s)$: $\mathbf{F}_{1D}[g(\phi, s)]$, is equivalent to the slice cut at angle ϕ from the 2D Fourier Transform of the image.



Strategy: from $\mathbf{F}_{1D}[g(\phi, s)]$ slices reconstruct $\mathbf{F}_{2D}[f(x, y)]$
and then take inverse transform to get $f(x, y)$!

Direct Fourier reconstruction



$$G(\phi, \omega) = \int e^{-j\omega s} g(\phi, s) ds$$

$$F(u, v) = \iint f(x, y) e^{-j(ux+vy)} dx dy$$

$$f(x, y) = \frac{1}{4\pi^2} \iint F(u, v) e^{j(ux+vy)} du dv$$

Fourier slice

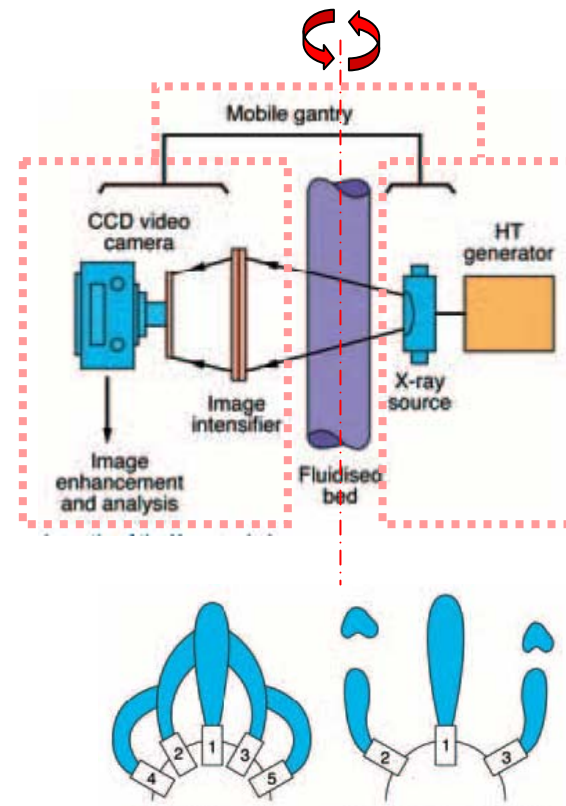
2D Fourier T of $f(x, y)$

Inverse 2D Fourier T of $F(u, v)$

X-ray CT in Fluidized Beds

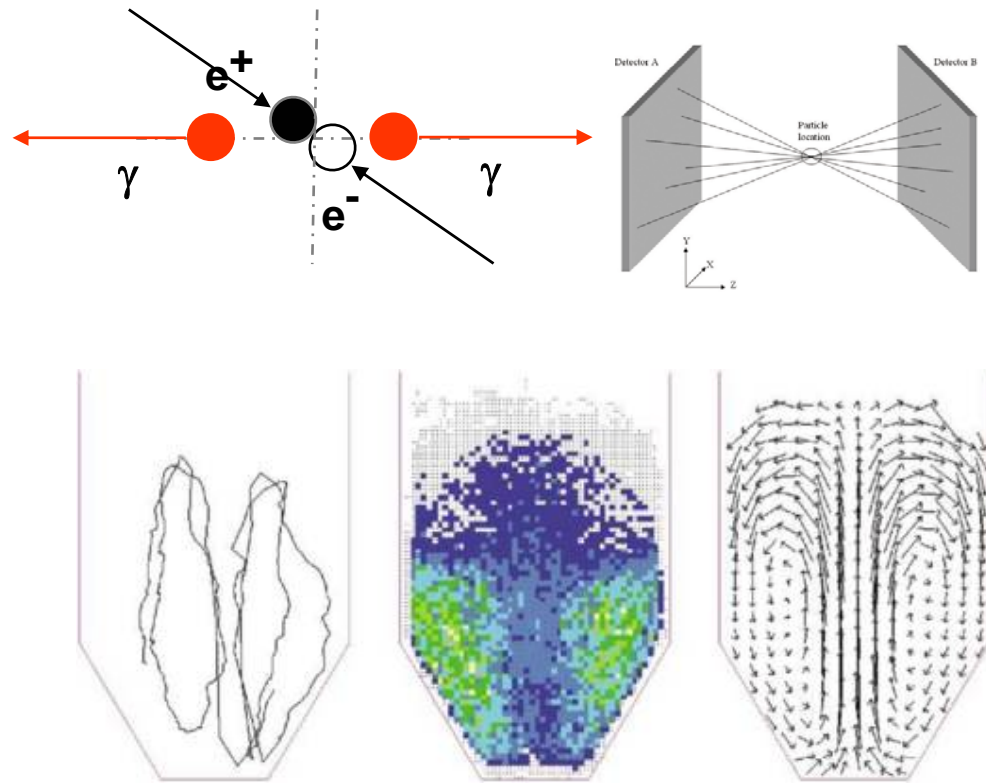


David Newton, BP



Positron Emission Tomography

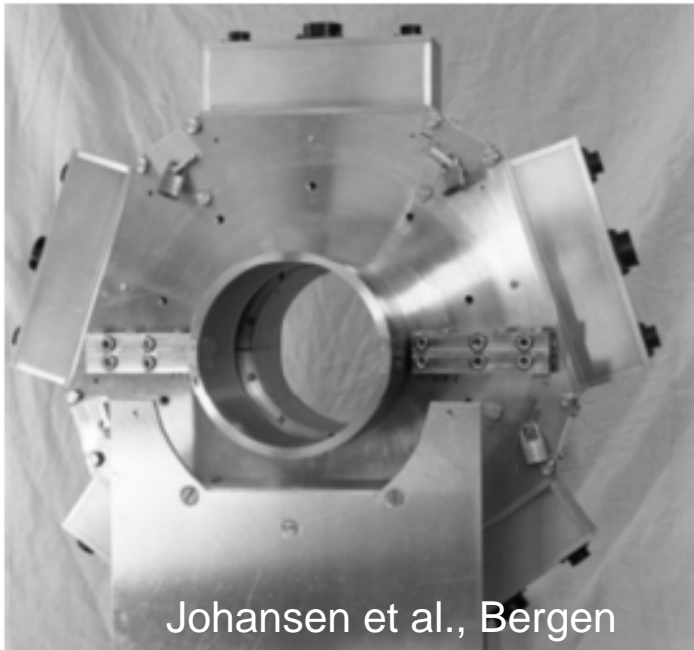
Positron Emission Particle Tracking (PEPT)



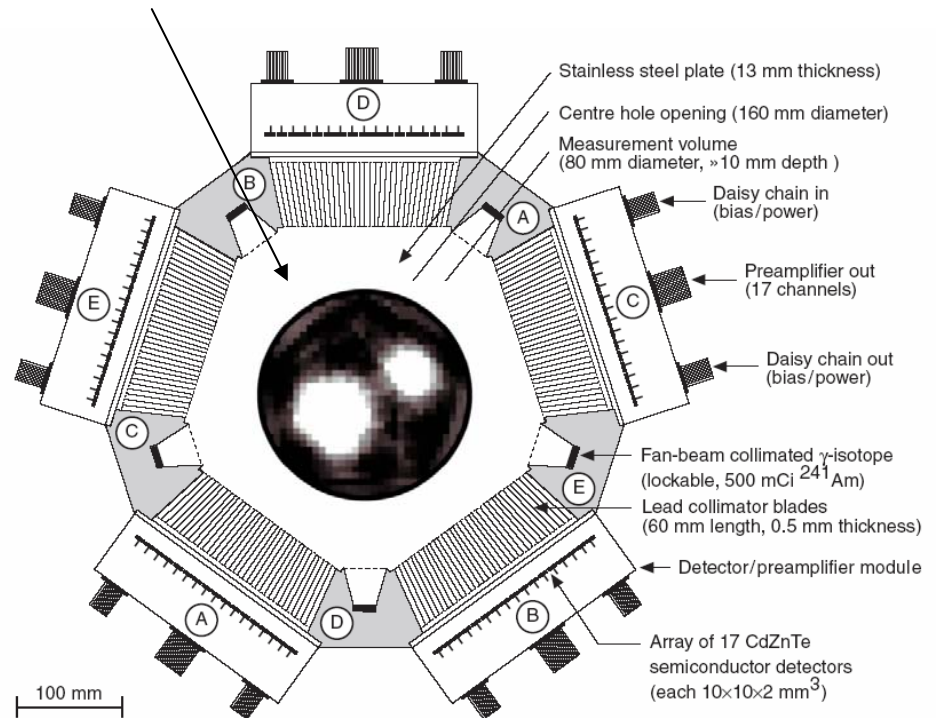
Particle tracking, occupancy and velocity field

Gamma-ray Tomography

Stationary subjects



Polypropylene/air

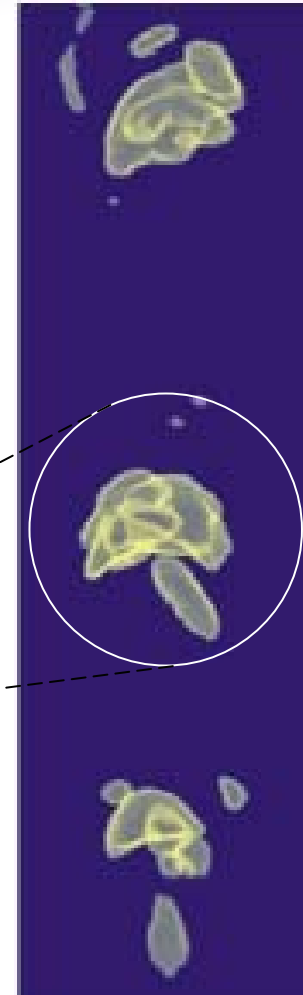
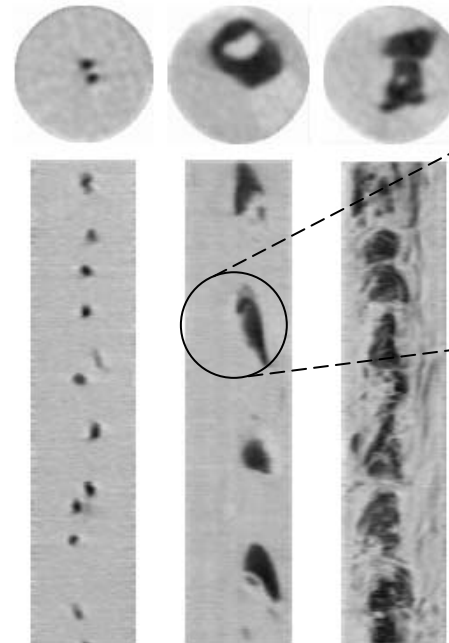
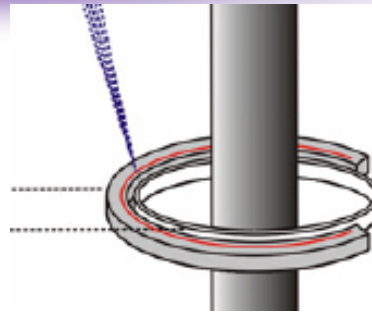


X-ray Tomography

Kinetics in bubble column



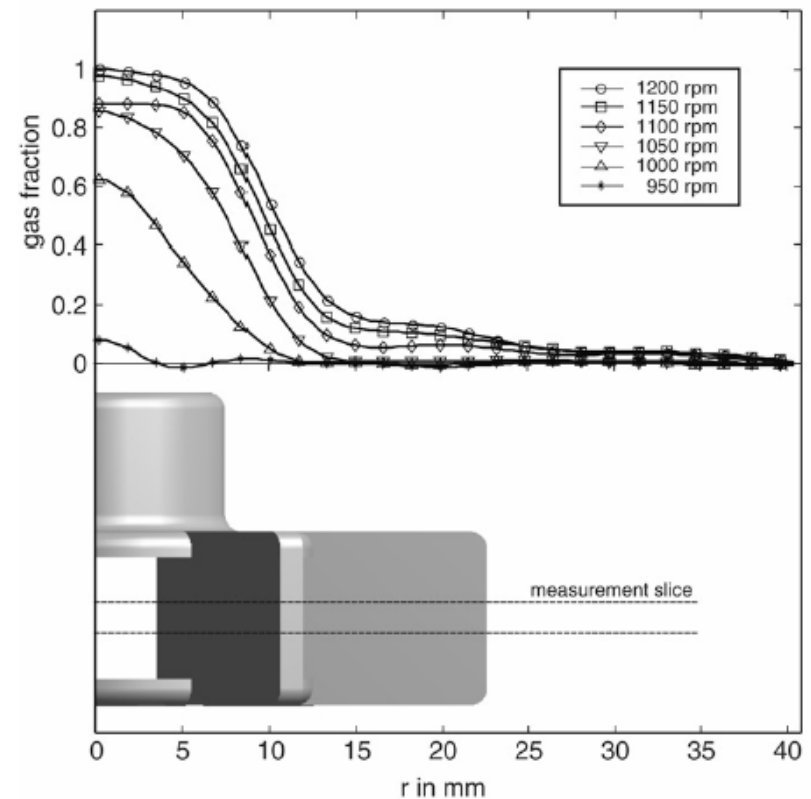
Hampel et al, FZD Dresden



Gamma-ray Tomography

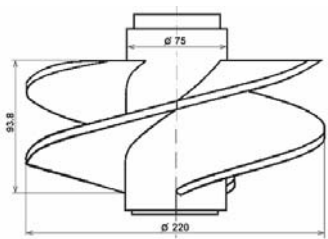
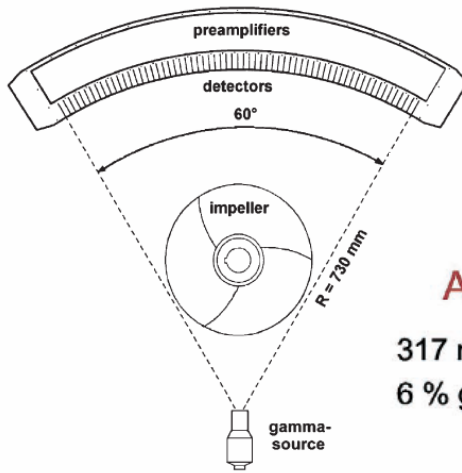
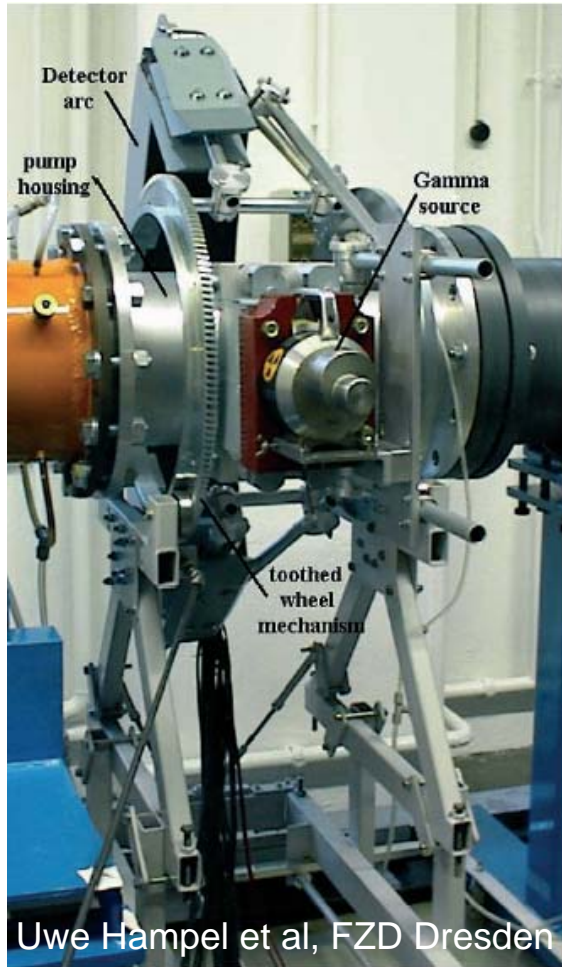
Fast rotating subjects - gas holdup in stirred reactor

Hampel et al, FZD Dresden

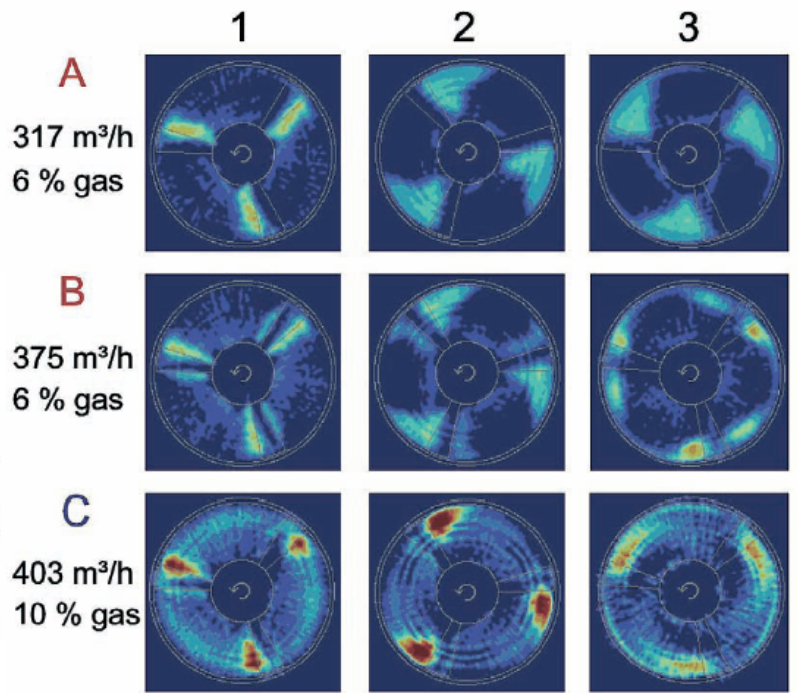


Gamma-ray Tomography

Fast rotating subjects - pump impeller



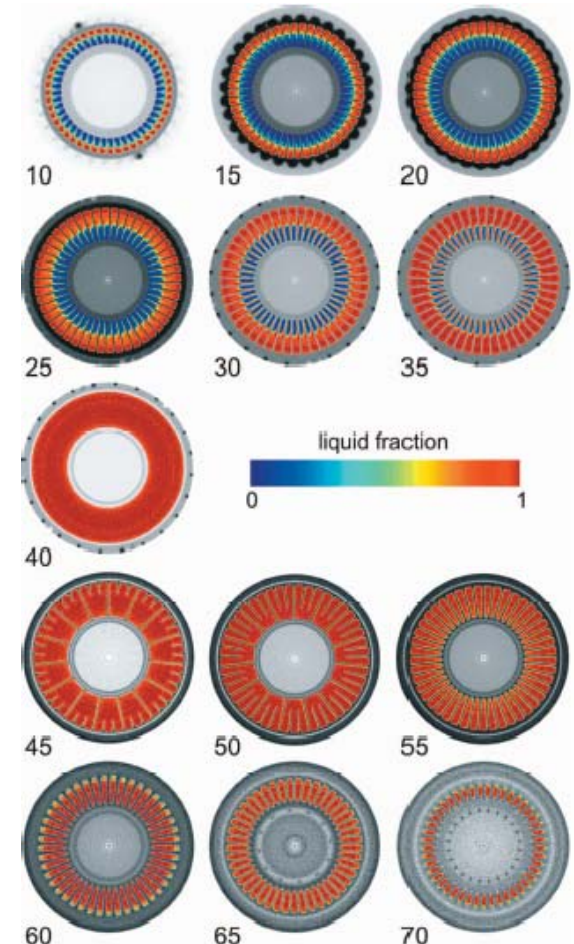
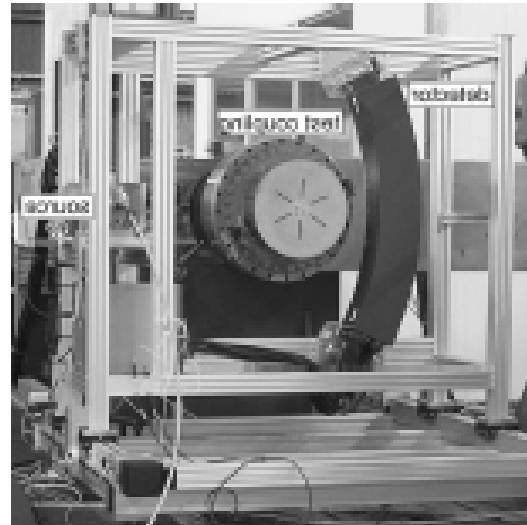
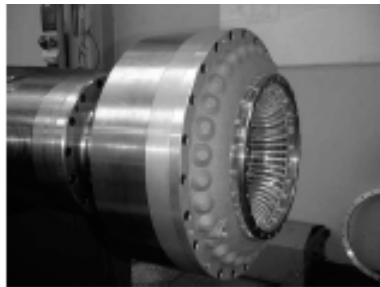
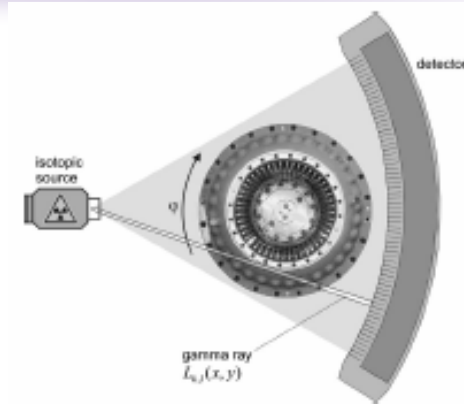
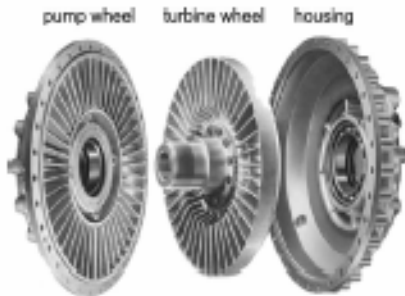
Axial positions



Uwe Hampel et al, FZD Dresden

Gamma-ray Tomography

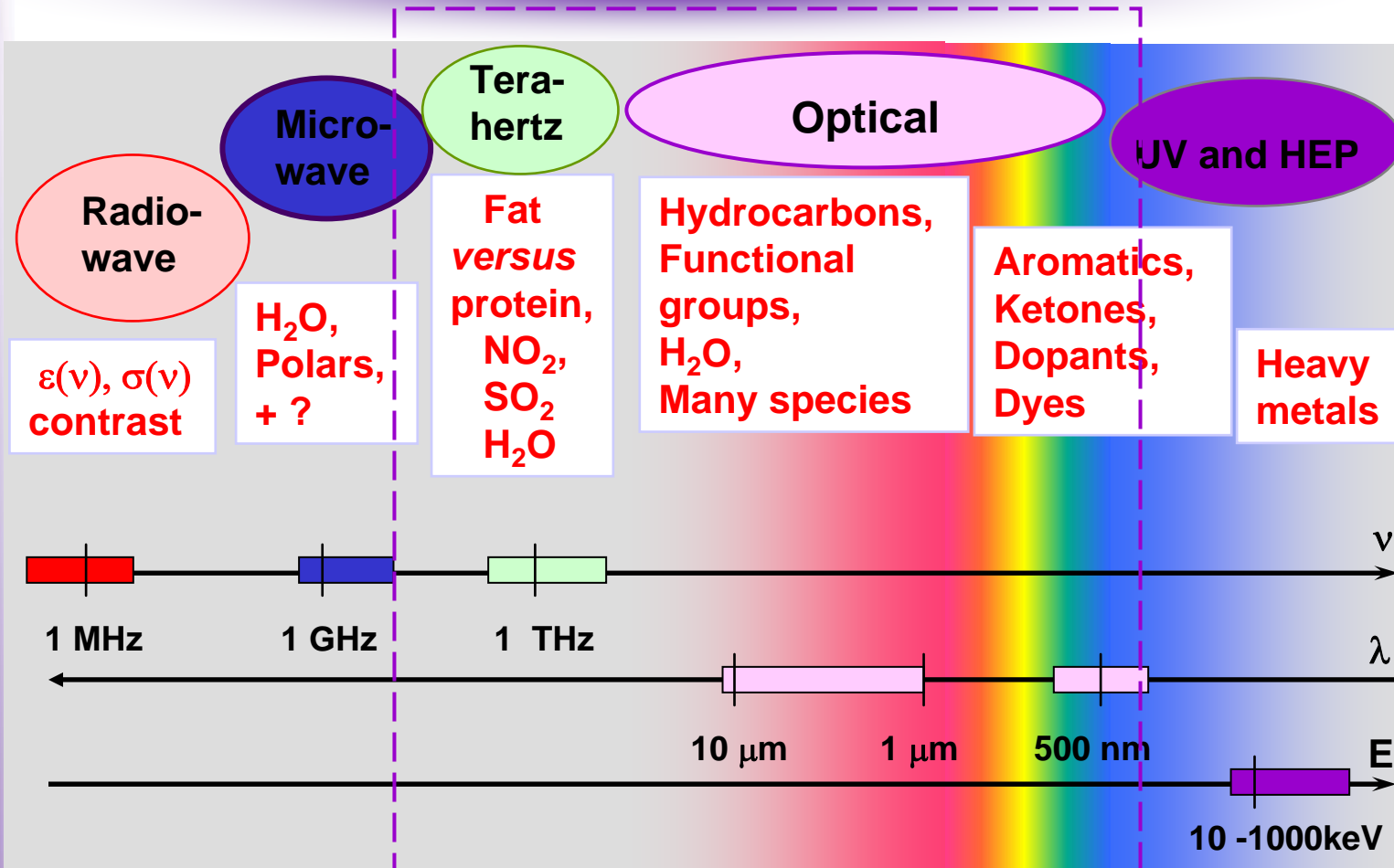
Fast rotating subjects - fluid coupling assembly



Uwe Hampel et al, FZD Dresden

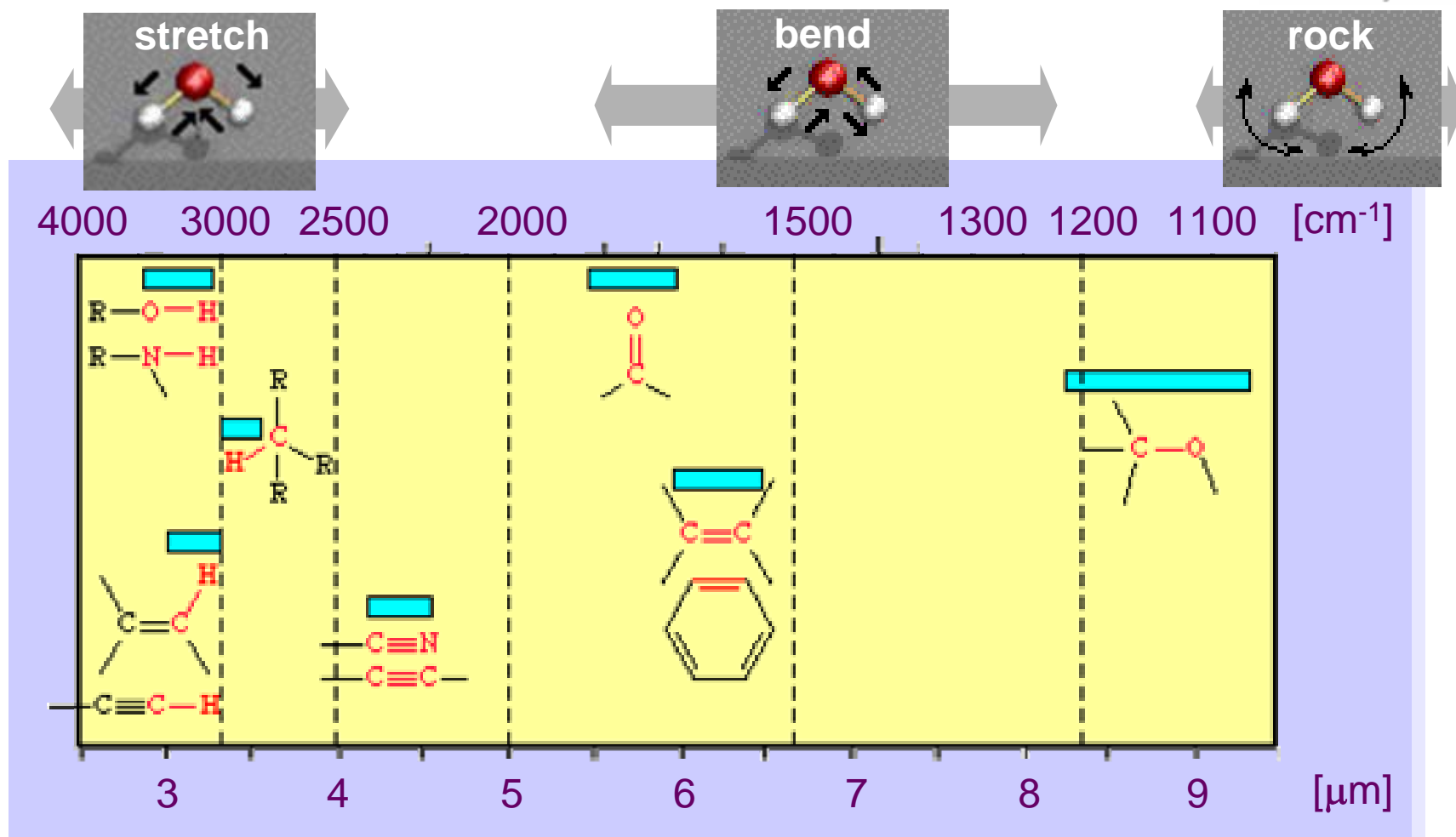
Challenge 1: 'Spectroscopic' Tomography

Interaction of EM field with matter



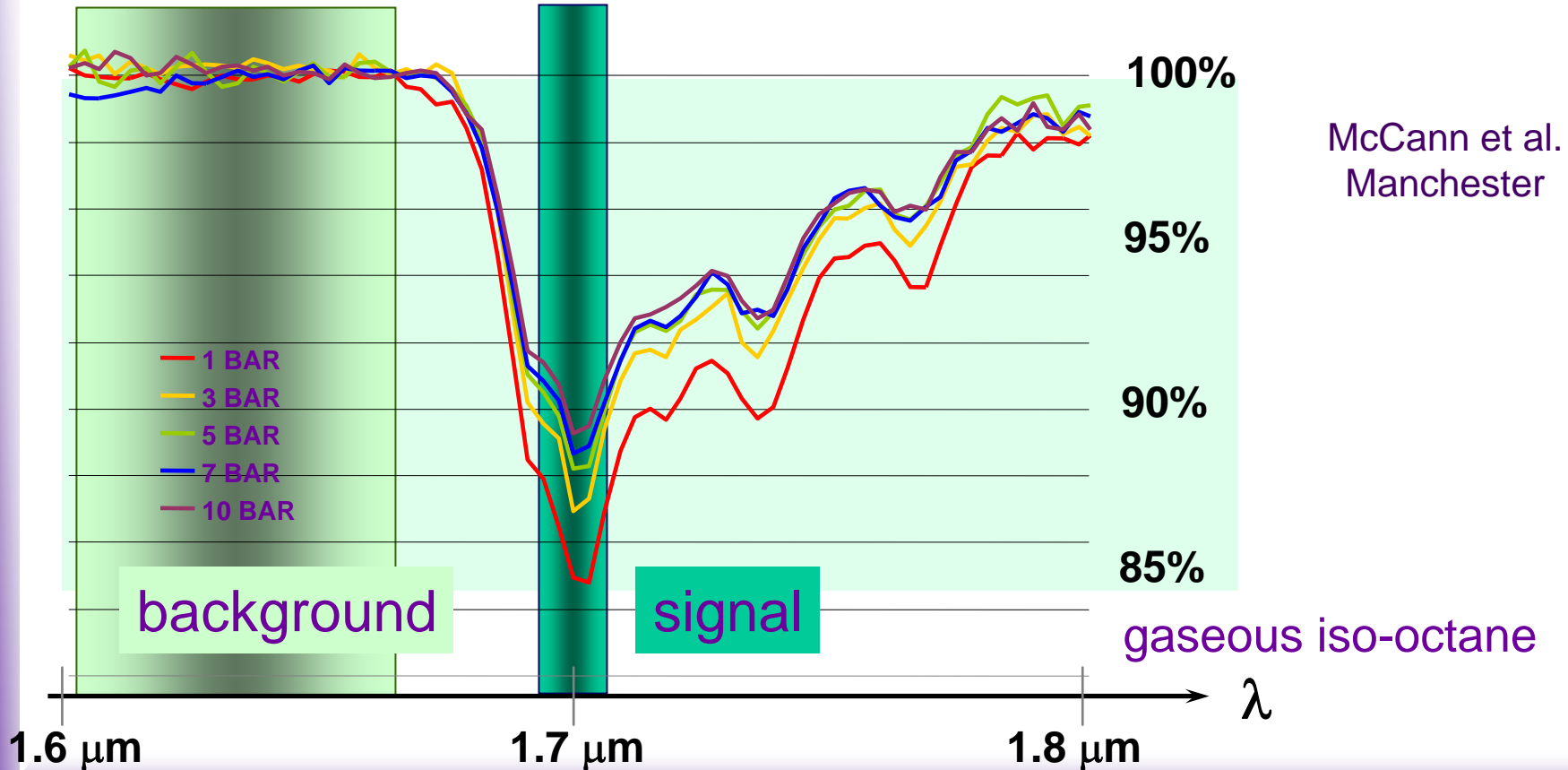
Modalities: Absorption, Scattering, Emission, etc

Mid IR optical fingerprints

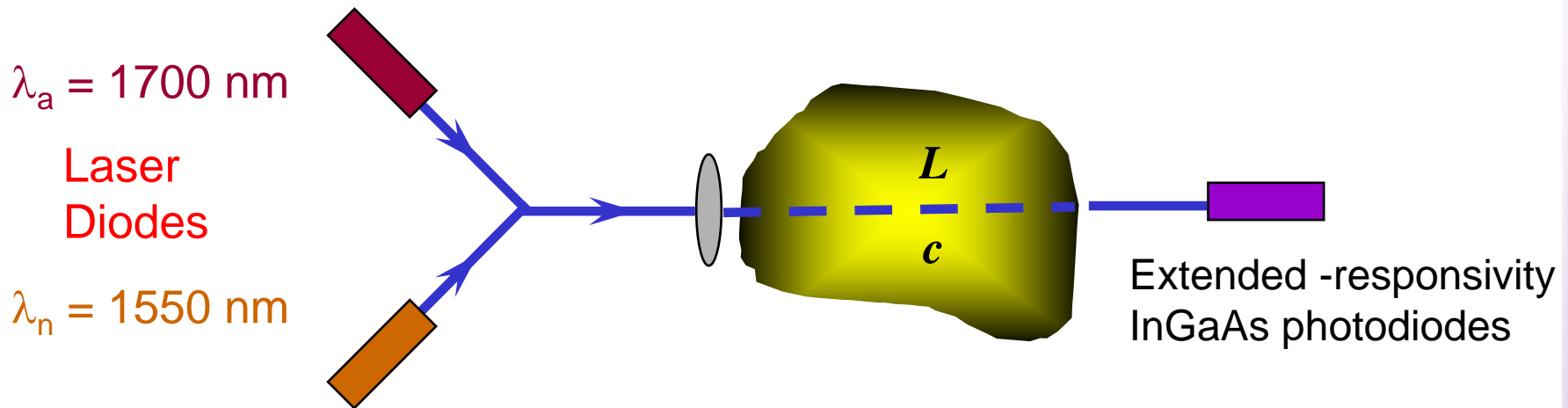


Hydrocarbon near-IR absorption (C-H bond)

- Choose signal wavelength to measure attenuation+background
- Choose reference wavelength to measure background



Single channel design for 1700nm



$$I_{\lambda}(L, T) = I_{\text{res}_{\lambda}}(0) e^{-\alpha_{\lambda} c L} \cdot S(L) + I_{\text{th}_{\lambda}}(T)$$

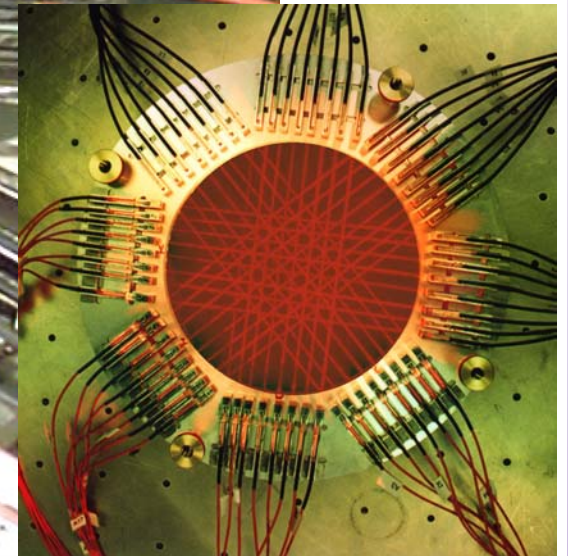
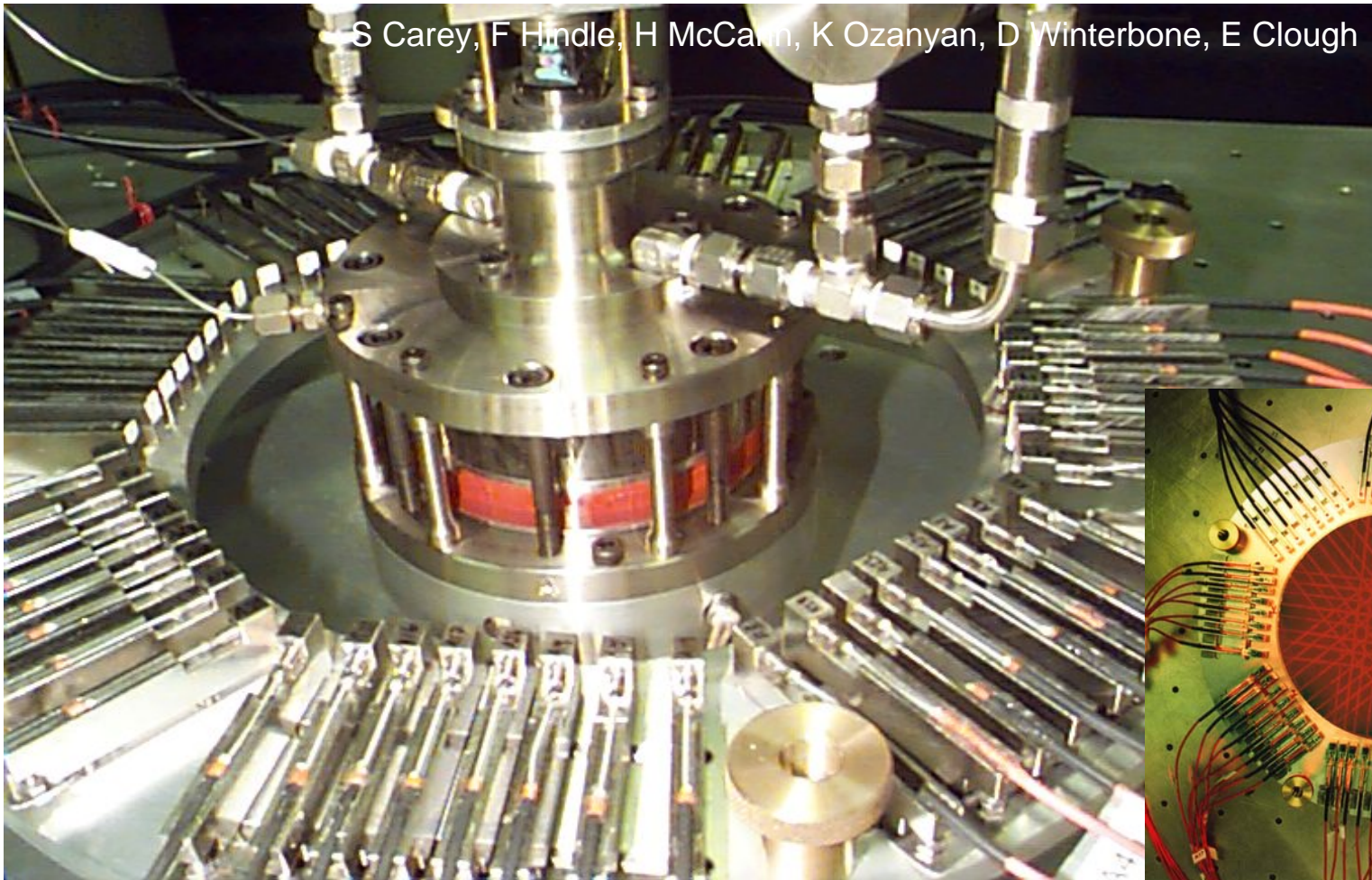
Resonant absorption

Non-resonant attenuation (scatter)

Thermal background

Engine cylinder simulator

S Carey, F Hindle, H McCann, K Ozanyan, D Winterbone, E Clough

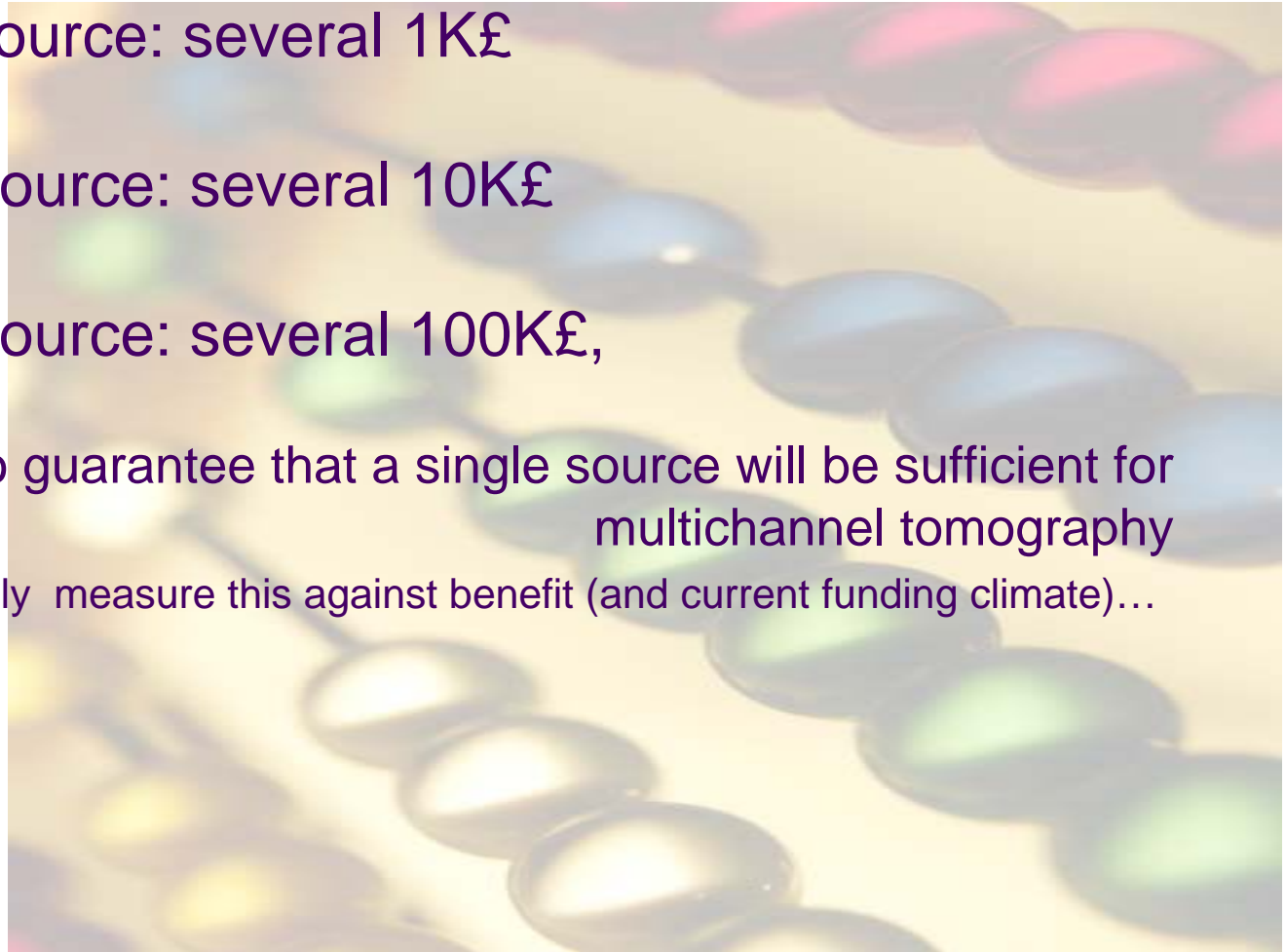


Cost of pushing Tomography to longer λ

- NIR emitter source: several 1K£
- MIR emitter source: several 10K£
- THz emitter source: several 100K£,

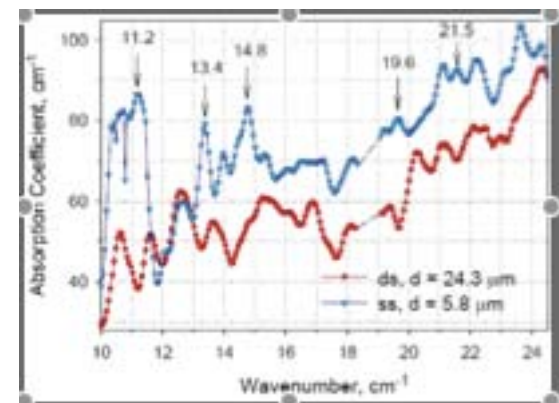
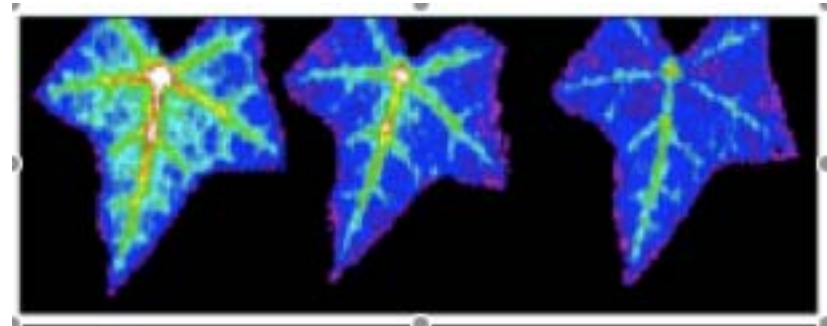
...with no guarantee that a single source will be sufficient for multichannel tomography

Carefully measure this against benefit (and current funding climate)...



Relevant properties of THz radiation

- High water absorption allows real-time monitoring of water content
- THz is suitable for long molecules: sensitive to both intermolecular and intramolecular vibrations in different chemical species:
 - Proteomics and drug discovery research probing 3D structure, folding and characterization.
 - Very sensitive to DNA hybridization and other interactions - single and double stranded DNA

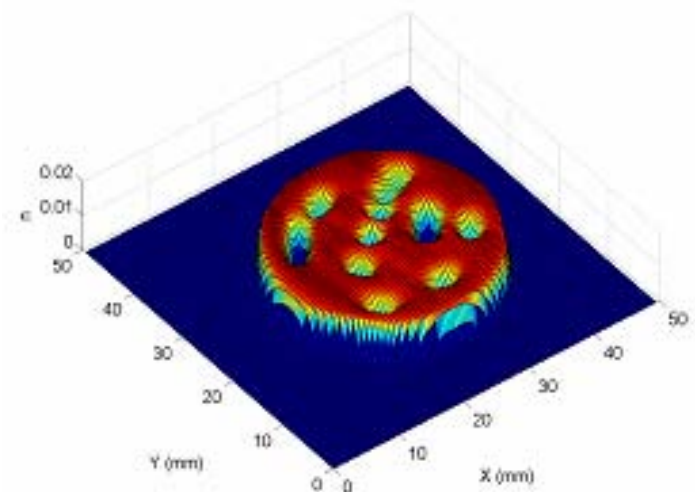
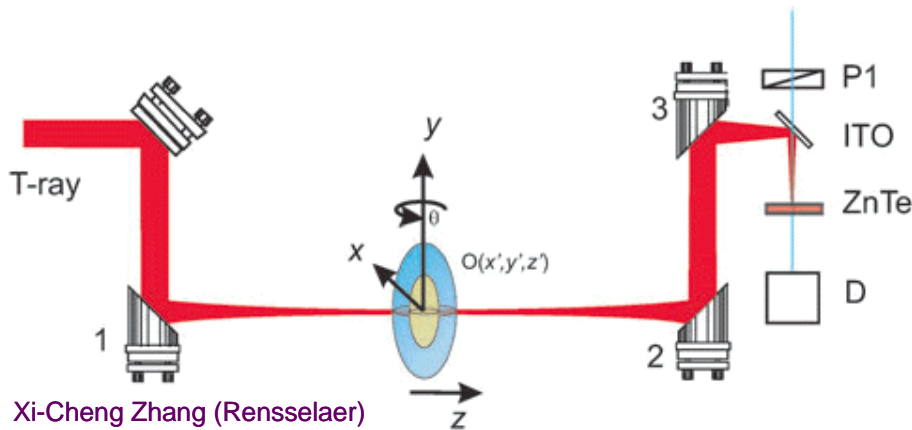


THz Computerized Tomography

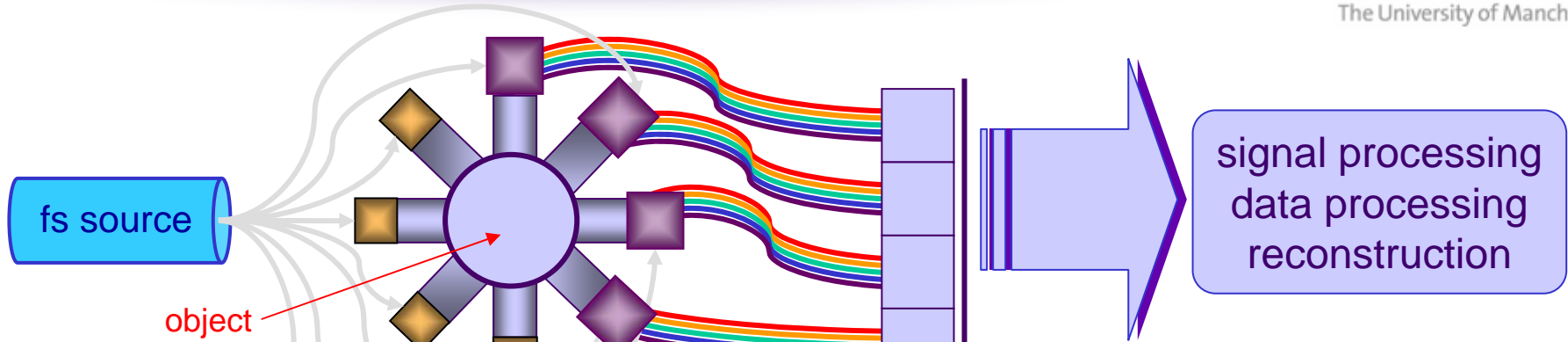
Currently THz CT is simulated only by rotation and translation of the object.

Known problems:

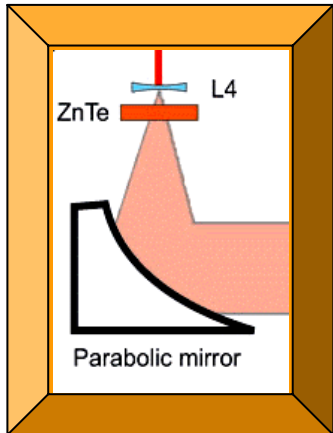
- difficulties with cost and ease to deploy
- complicated detection schemes
- “killer” applications?



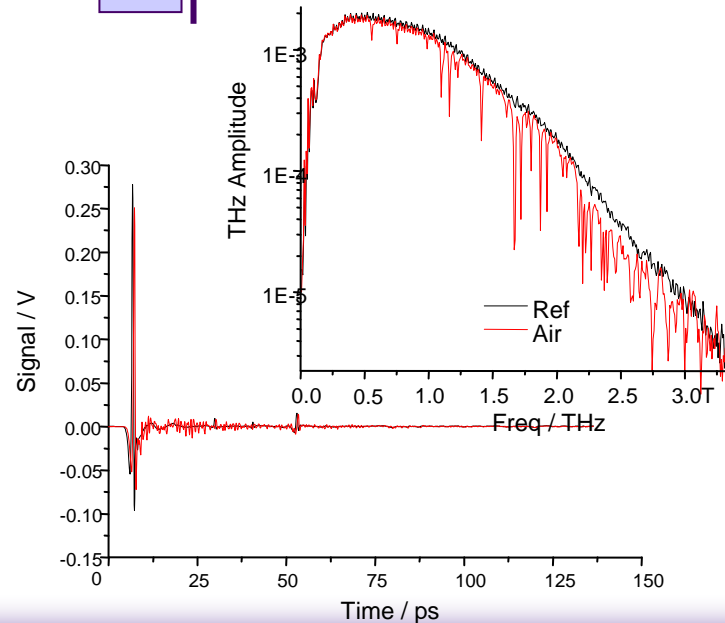
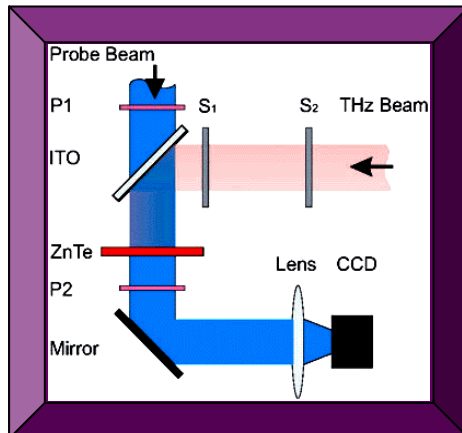
THz Tomography with ultrafast lasers



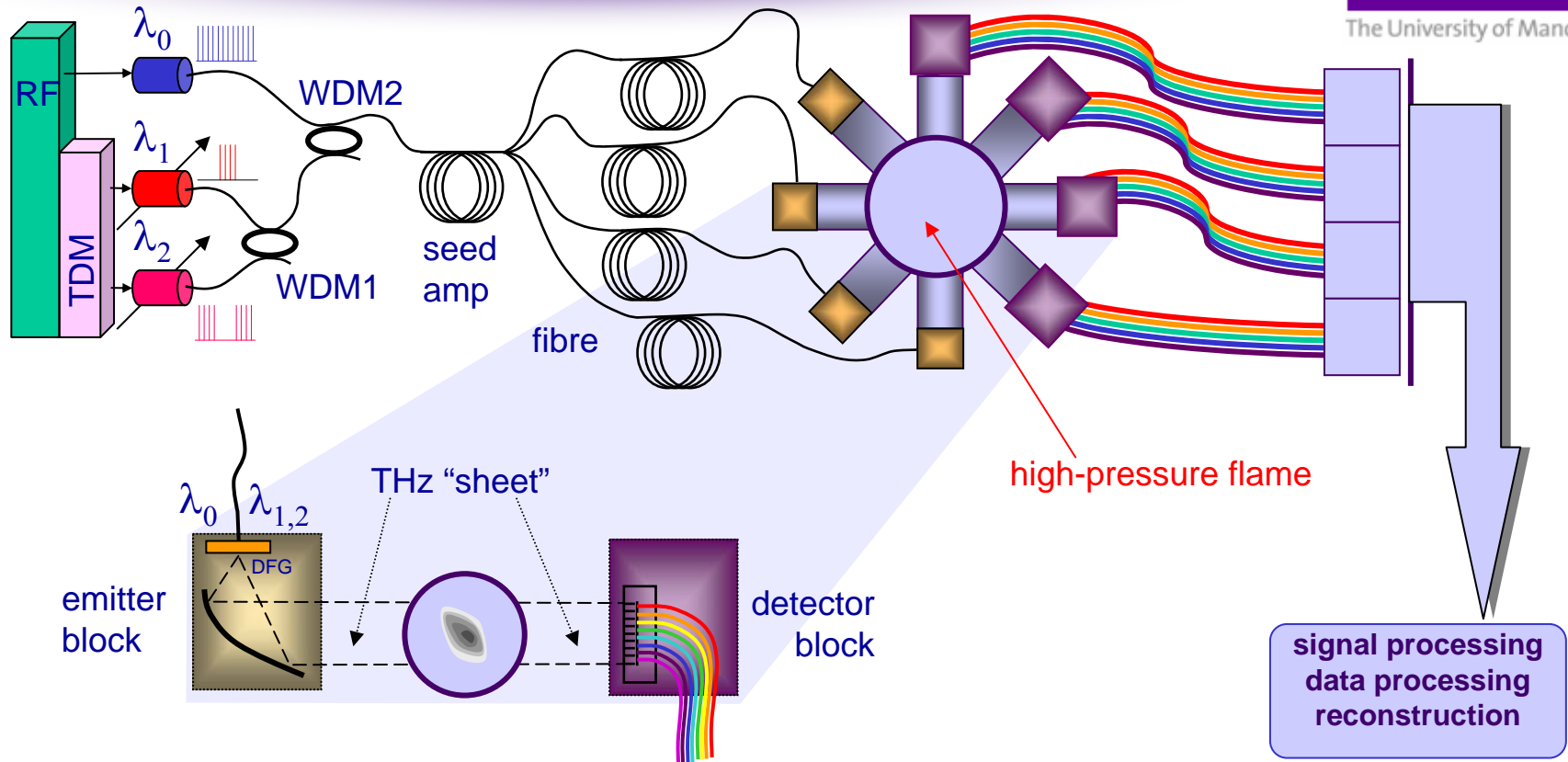
THz launch



THz receive

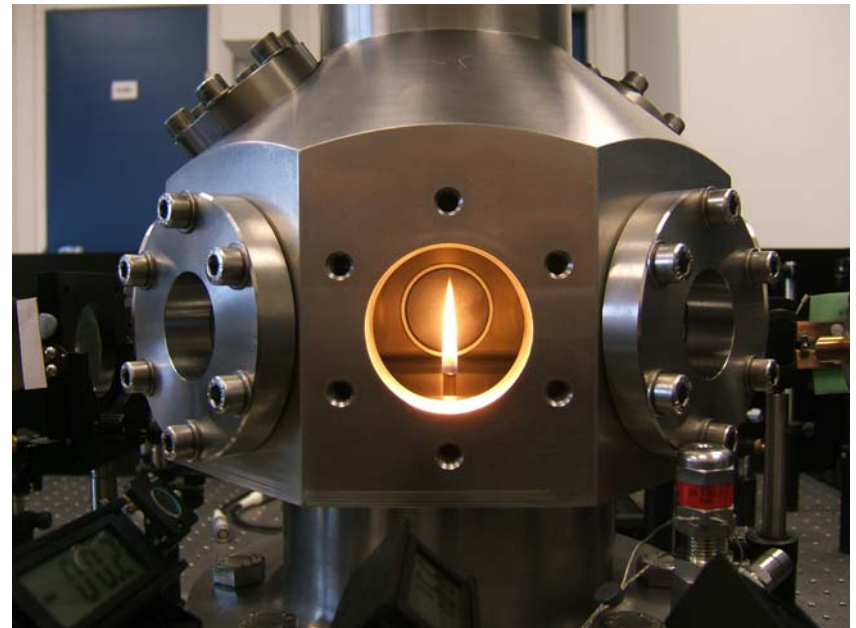
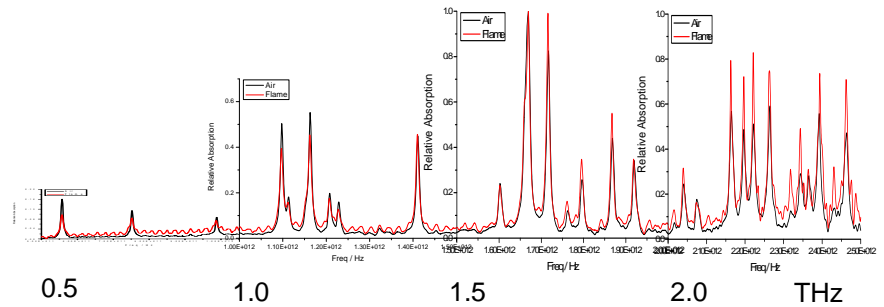
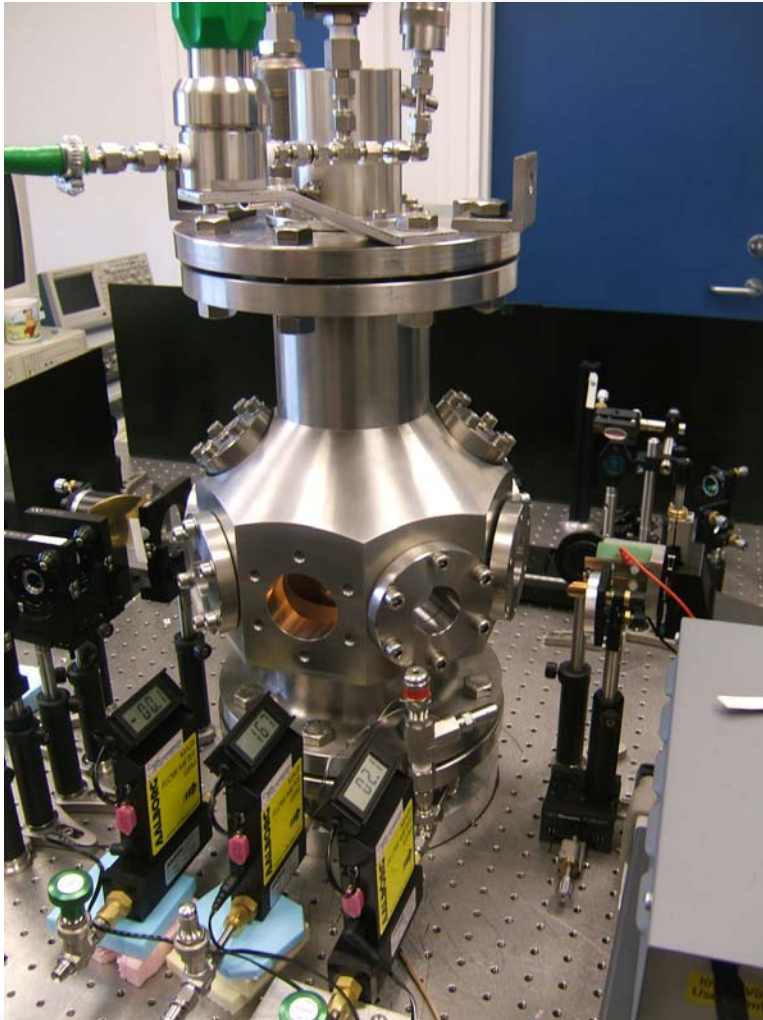


Narrowband Tomography – system layout



- A compact desktop system, delivering high THz power by DFG with a single seed
- Pyroelectric detector arrays will be used instead of coherent detection ($\sim 20 \mu\text{W}$ per array pixel)
- Easy for access and affordable THz

THz tomography in flames



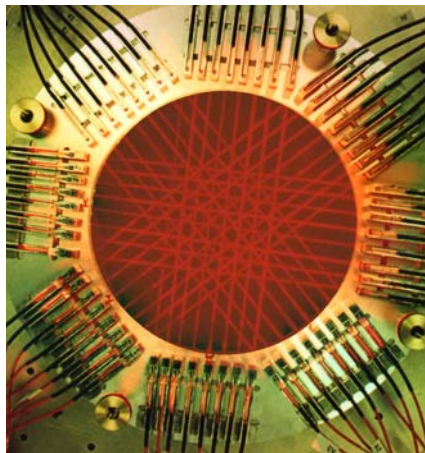
Challenge 2: Path Integrals

Similar maths, different physics

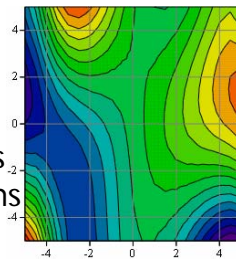
Guided Path Tomography (GPT) was pioneered in Manchester *IEEE Sensors J.*, 5 (2) 167 2005

Computer Tomography
e.g. straight propagating
electromagnetic
radiation

$$\Phi \approx \Phi_0 \int_0^L \mu(x) dx$$



Flat 2D
surfaces

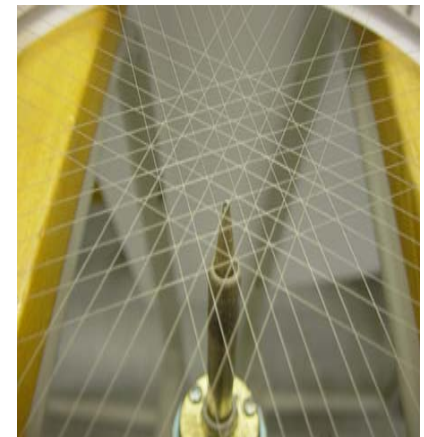


Radiation beam CT: Line integrals
are along individual straight beams

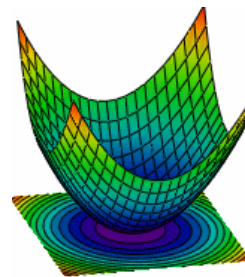


Guided-Path Tomography
e.g. guided propagation of
the electromagnetic
field

$$R = \frac{1}{A} \int_0^L \rho(T(x)) dx$$

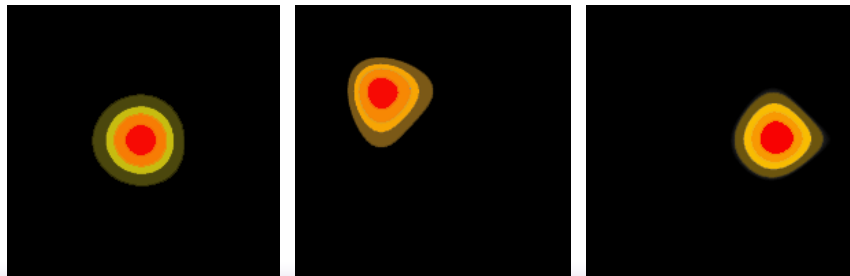
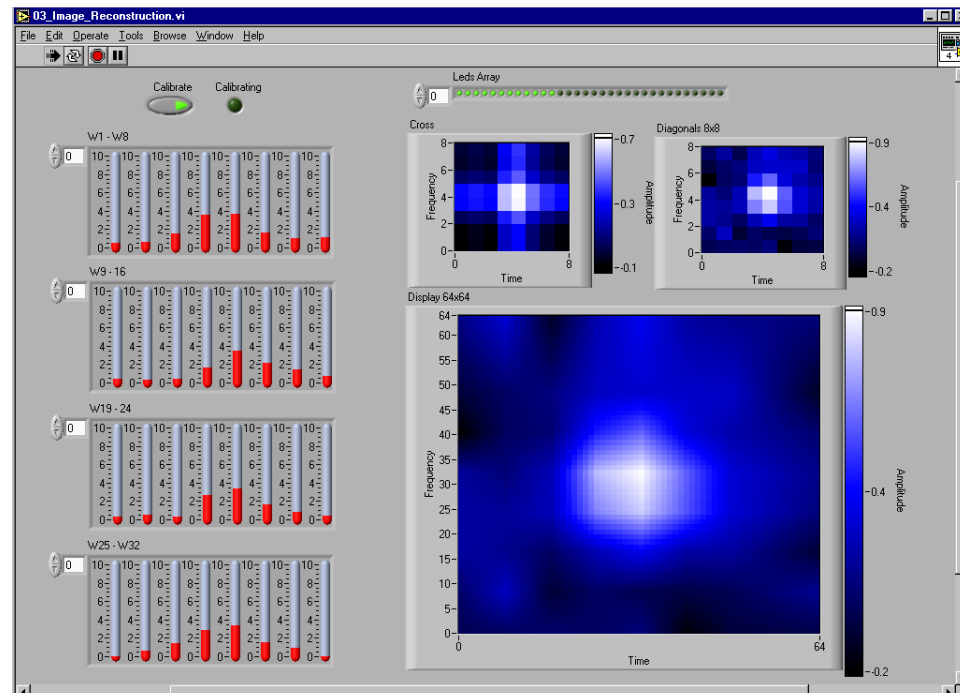
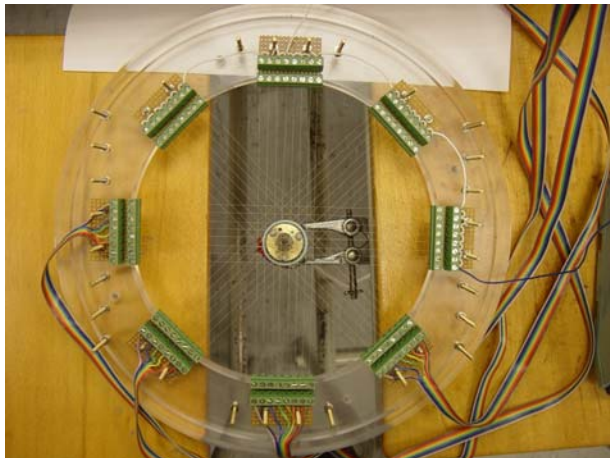
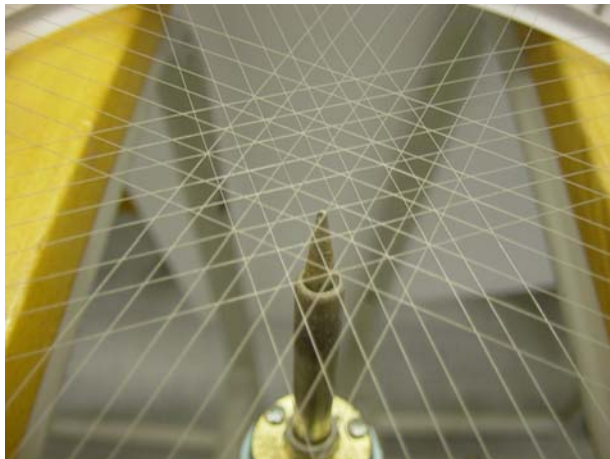


Curved
surfaces



Wire-mesh GPT: Line integrals are
along wires forming a flexible
"mat"

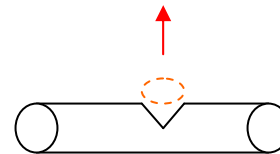
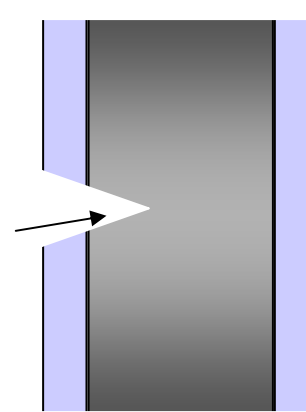
Temperature imaging with Wire-Mesh GPT



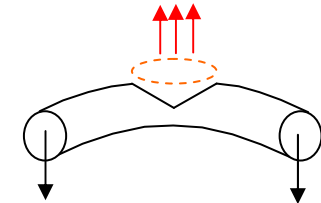
Optical fibre sensing

Bending loss sensing

Groove cut through cladding and into the core leads to losses as a function of bending



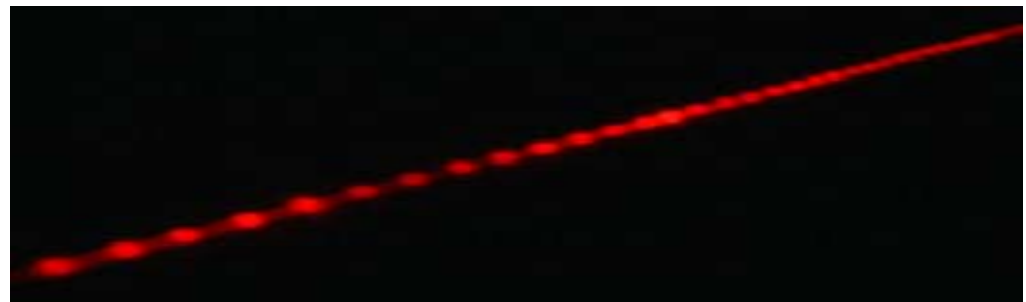
zero deformation



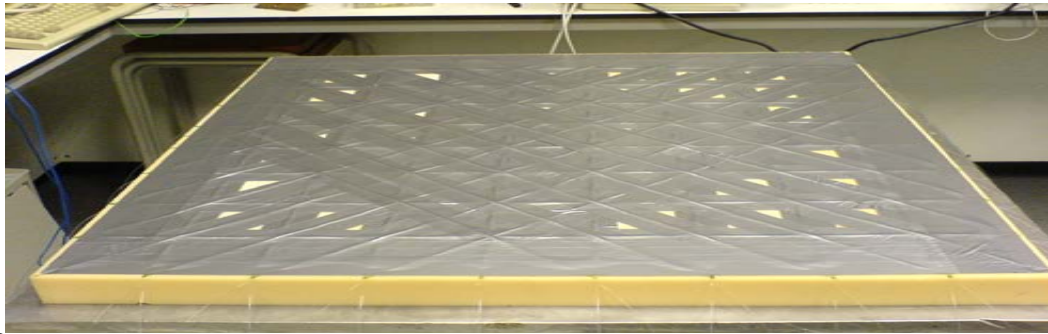
stretch and bend



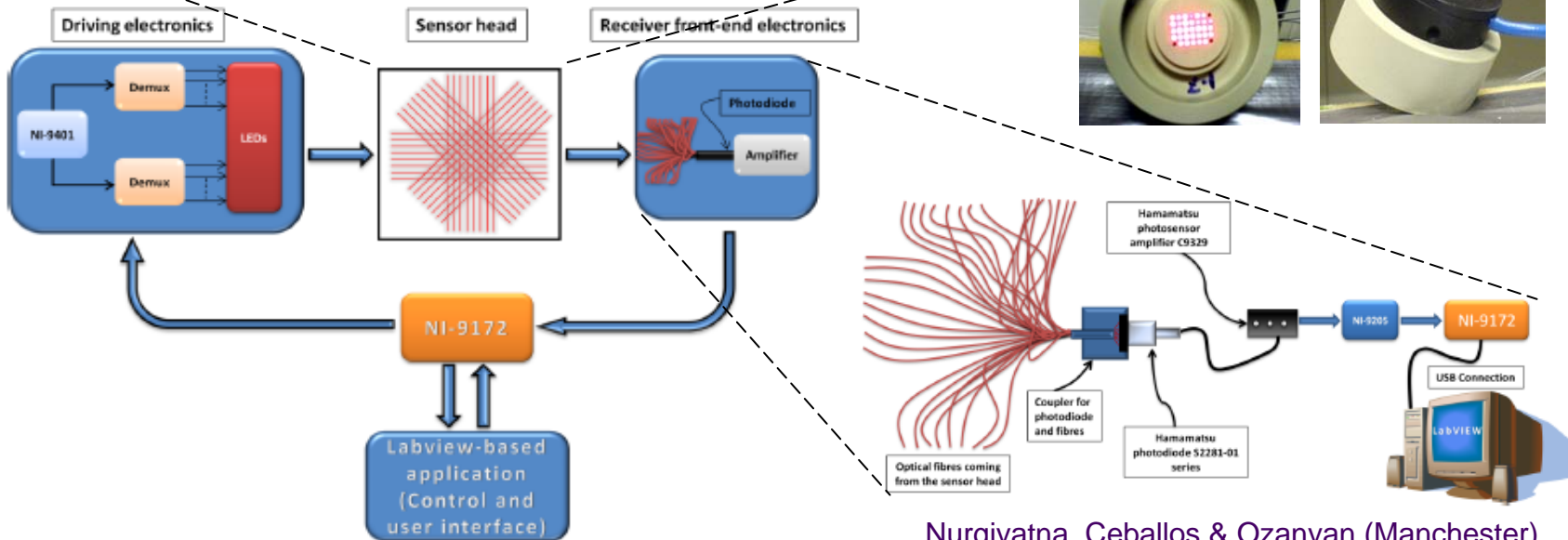
"Cold" groove



The 'deformation mat'

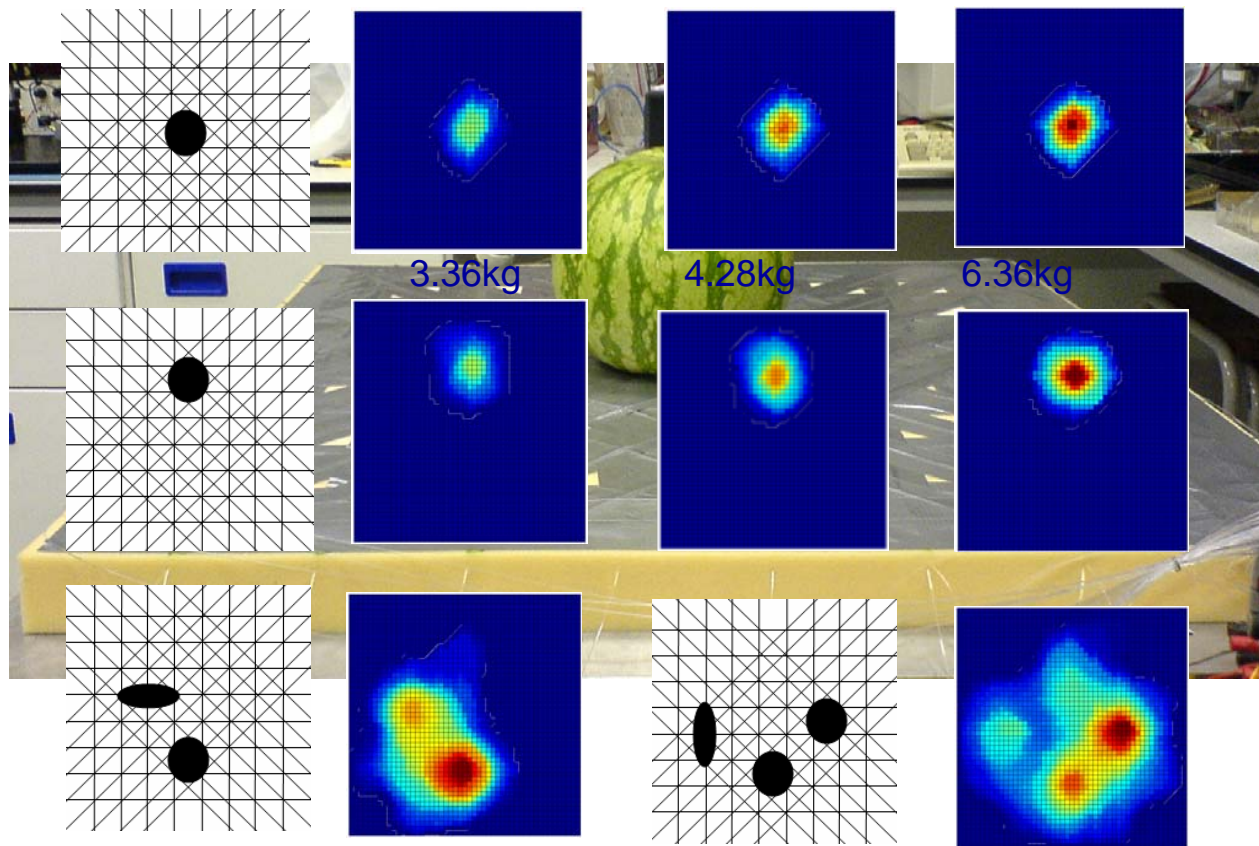


Measure intensity transmitted through a POF section



Nurgiyatna, Ceballos & Ozanyan (Manchester)

Photonic GPT algorithms and images

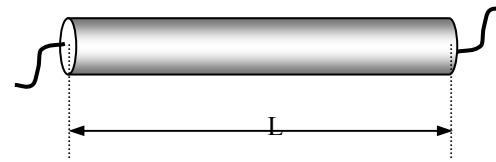
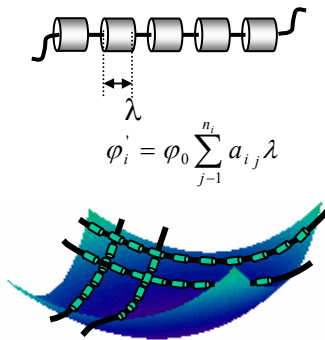
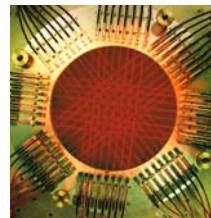


Nurgiyatna, Constantino, Davidson & Ozanyan (Manchester)

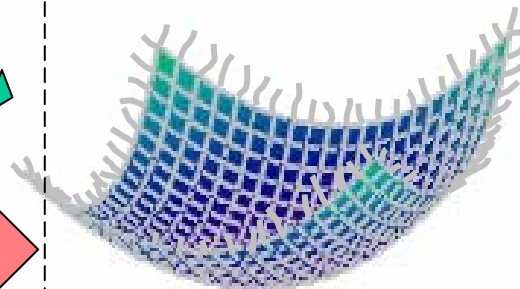
Large area monitoring by Tomography

Based on Guided Path Tomography, pioneered in Manchester
IEEE Sensors J., 5 (2) 167 2005

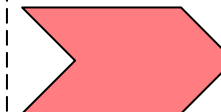
- uses analogy between the mathematics of x-ray Tomography scanners and current flowing through a wire mesh with the proper geometry.
- demonstrated for temperature with a wire-mesh sensor
- demonstrated for light propagating through fibres arranged in a near-flat plane



$$\varphi(l) = \varphi_0 \int a(D(x, y, z)) dl$$



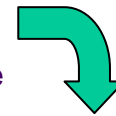
LED light sources
- <£1/pc



Photodetector, electronics,
computation and display
- £1000

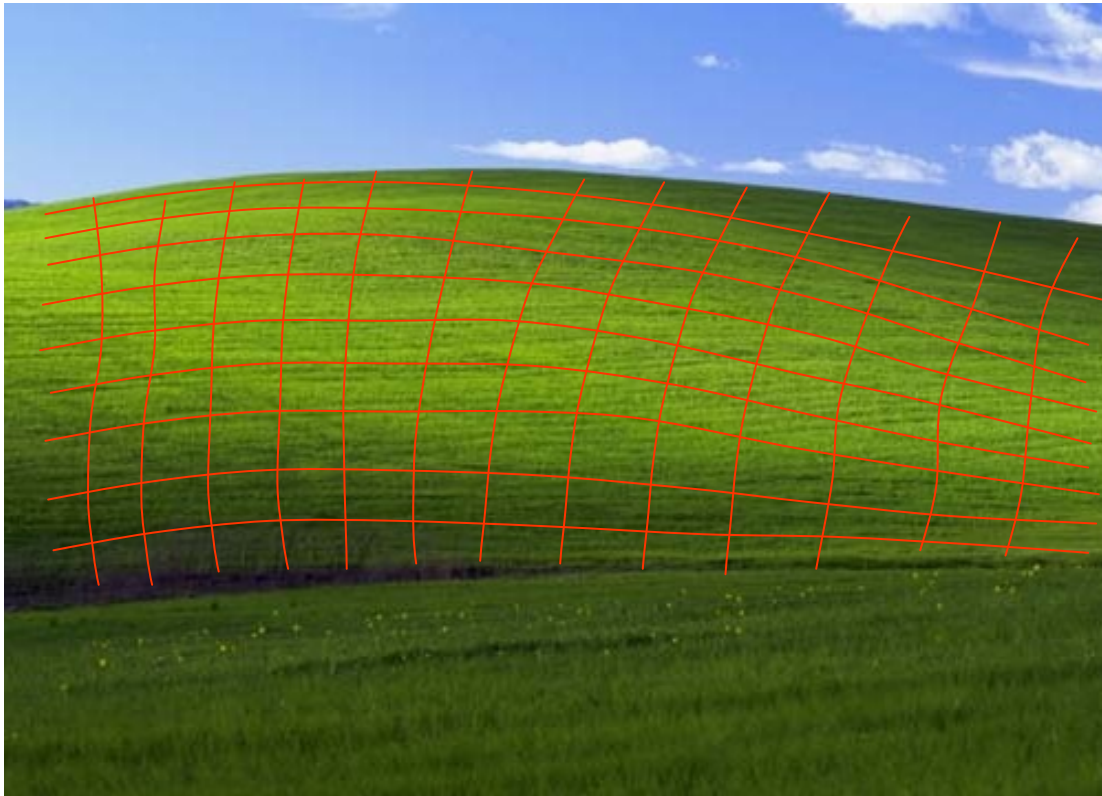


Only this scales with size!



Photonic GPT for large areas

Measure integrals of attenuation instead of individual sensors
Reconstruct an image of the measurand

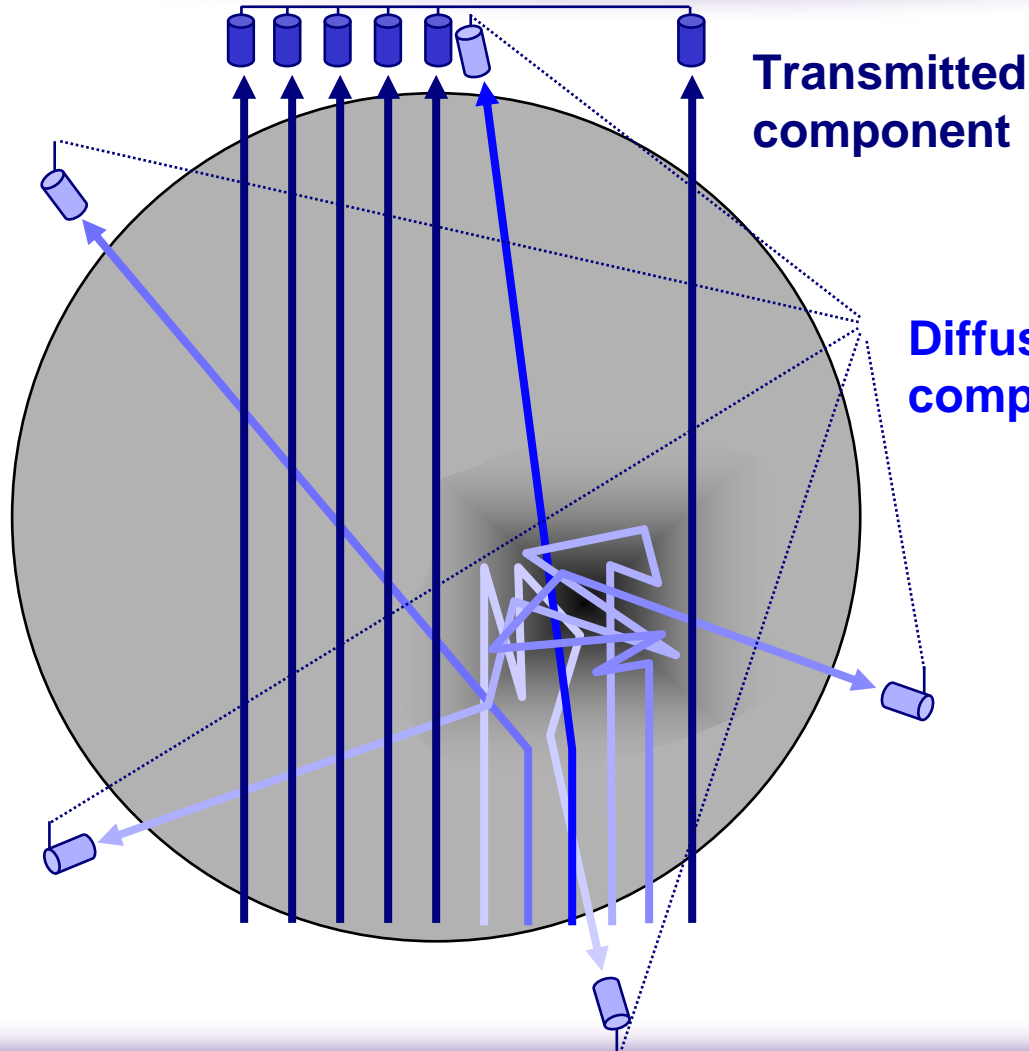


Plastic optical fibre
- £0.80/m

LEDs - around £1

Small number of
photodiodes

Well-behaved line integrals?



Transmitted component

- small attenuation, trajectory unchanged.
- “hard” field, leading to Radon transform

Diffuse component

- attenuation+change in direction
- multiple “scattering” events
- forward model is based on the Diffusion Equation

General case

- both components can be essential
- forward model is based on the Transport Equation

THz hard-field tomography

CT “line integrals” across the subject have different nature:

Amplitude contrast

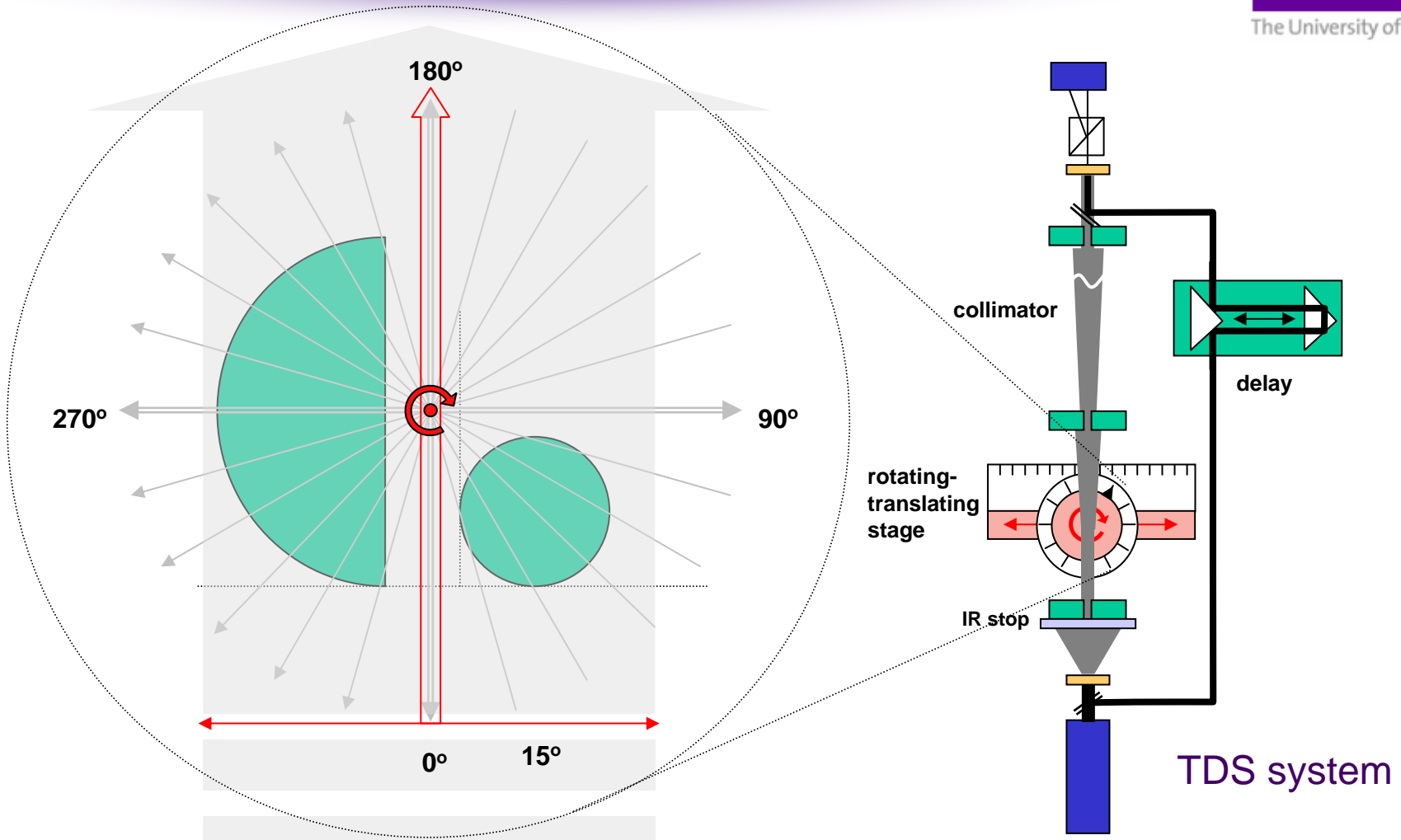
vs

Delay contrast

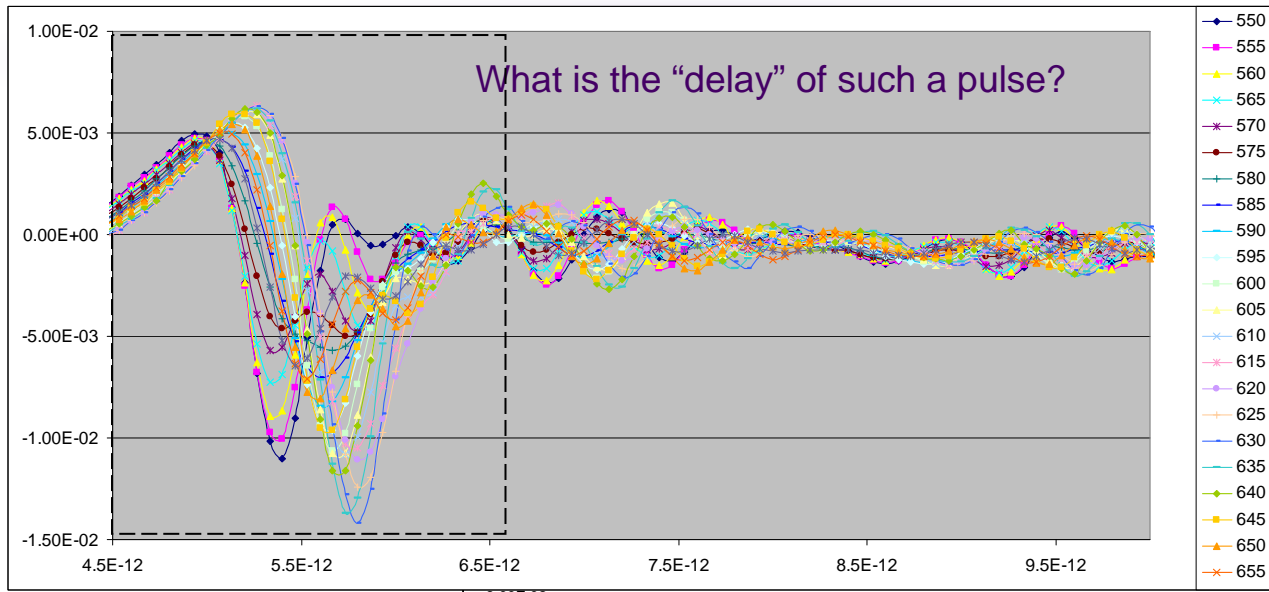
- Measured transmitted component gives line integrals of attenuation (species' c, T)
 - **Images the spatial distribution of material density**
 - The diffuse component eliminated by collimation, 2λ strategies, etc.
 - Possible with TDS or CW
- Measured time delay gives line integrals of inverse group velocity (non species-specific $n(p, T)$)
 - **Images the spatial distribution of optical density**
 - The diffuse component eliminated by taking ballistic photons only
 - Possible with TDS or CW (coherent detection)

Complex phantom

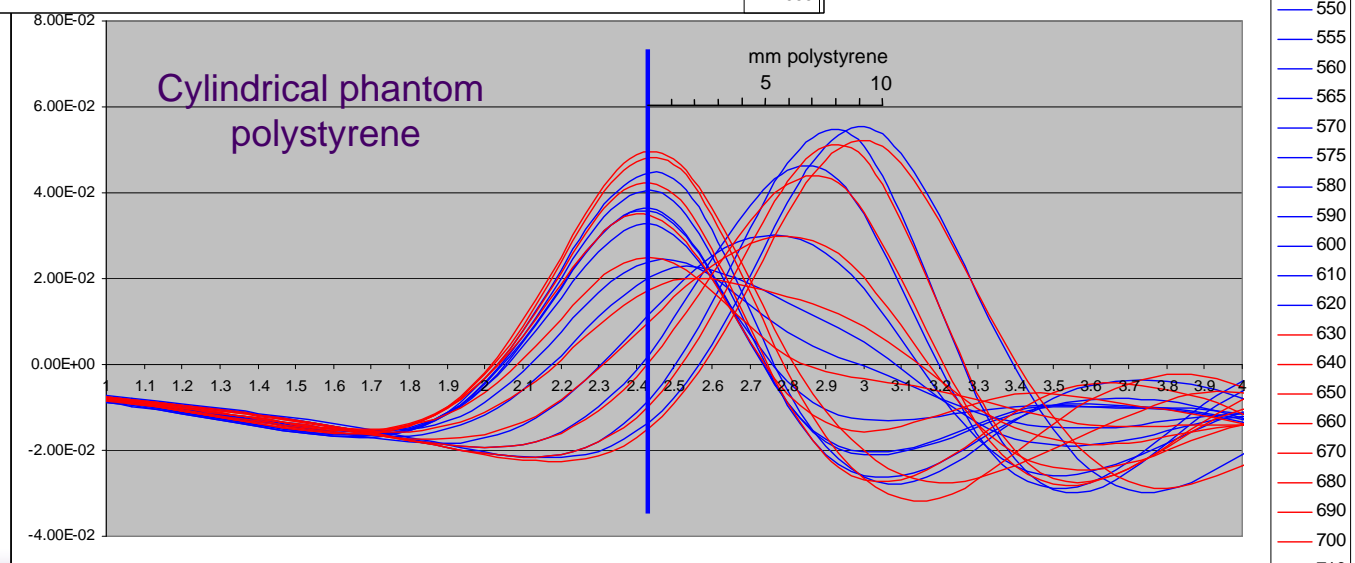
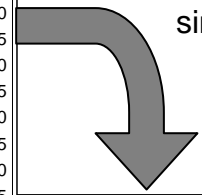
Refractive index imaging from only 12 angles



Extracting delay from waveforms

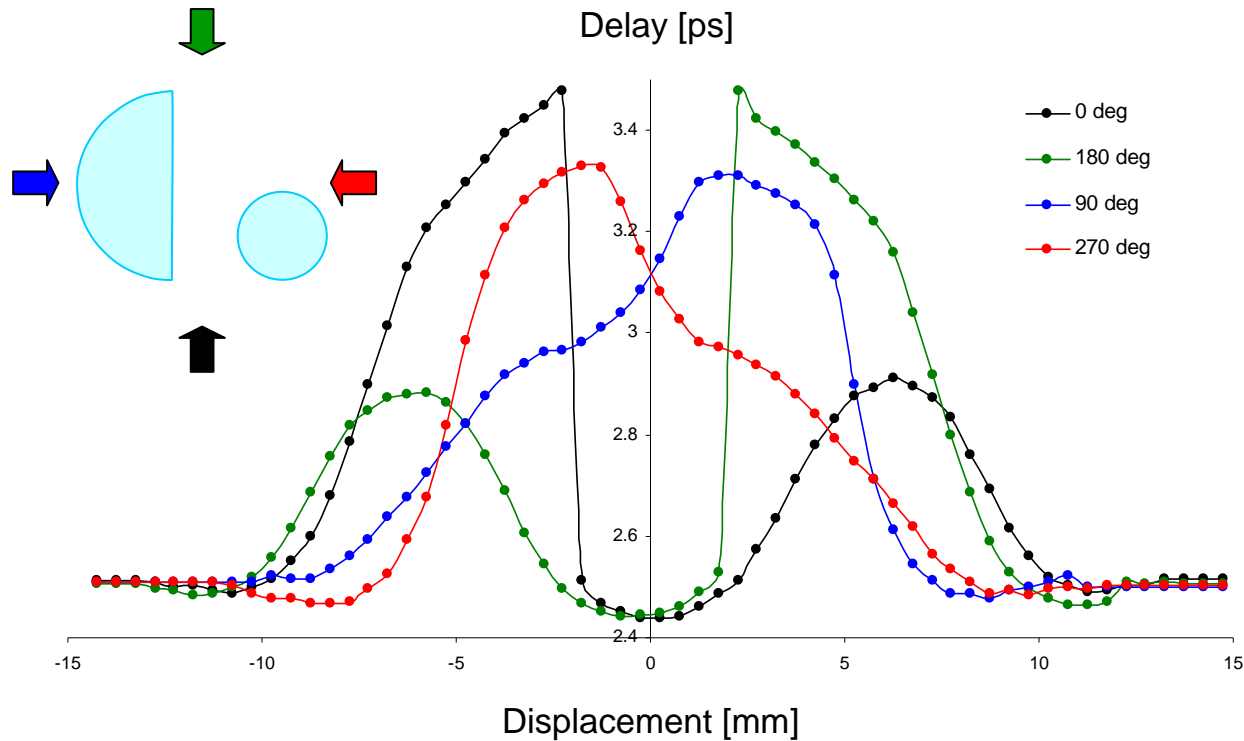


Antenna emits as the derivative of the current: Integration of the first 4ps of the THz waveform allows comparison of delays in terms of a single pulse.



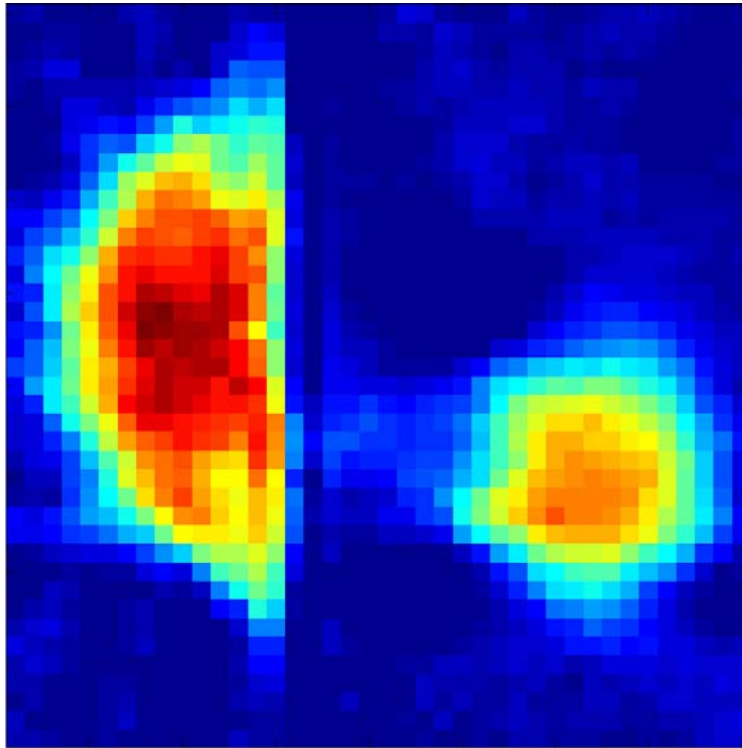
The delay is calculated by a quadratic approximation of the position of the maximum of the integrated pulse

“Mirror” projections

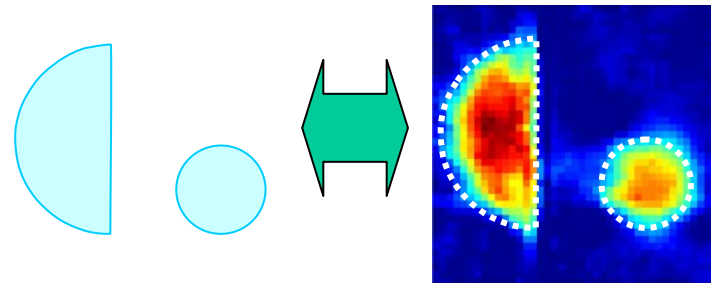


- The measured photons are “ballistic enough” – there is very little difference in which of the two objects is seen first
- Ballistic photons give us spatial resolution of the order of the wavelength

Refractive index reconstruction



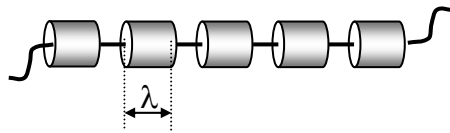
Phantom with (scaled) exact dimensions
on top of the reconstruction:



- Standard 40x40 grid, 12 projections (still limited view!)
- Standard inverse problems regularisation, such as non-zero constraints and periphery suppression
- Sharp edge is unrealistic – coincided with a line integral.
- “Glowing” sharp corners and flat result from scattering and grazing incidence reflection

Why is temperature difficult for tomography?

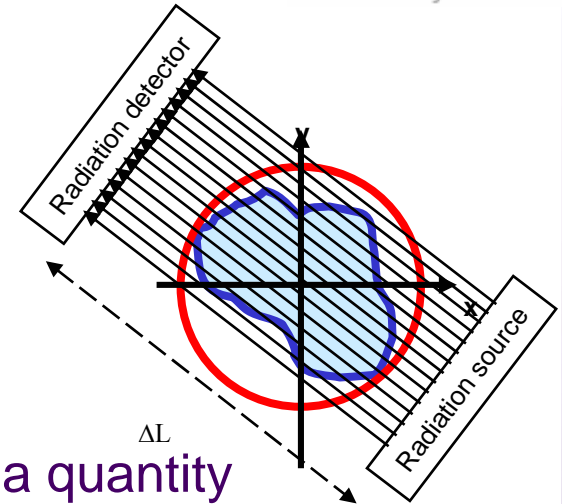
- Temperature path integrals do not exist!!!



$$N_d = N_s \int_{\text{path}} \mu(L).dL$$

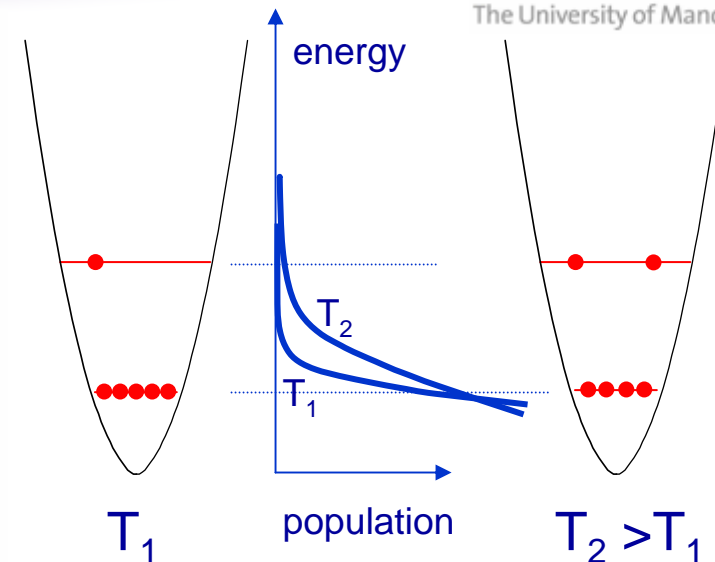
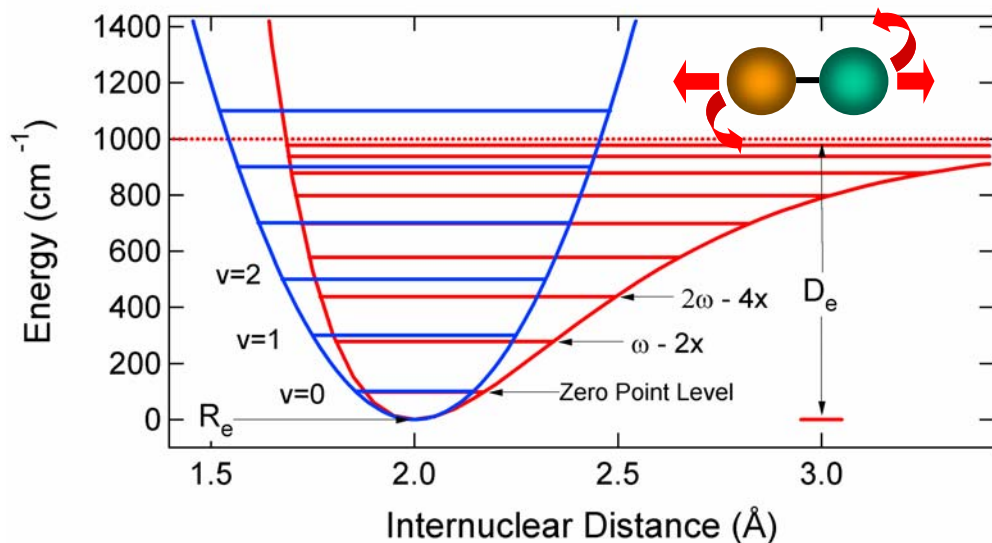
$$R = \frac{1}{A} \int_0^L \rho(T(x))dx$$

- In the case of guided-path tomography we found a quantity giving a path integral: resistivity (serially connected resistors). Can we find others?



- Imaging has to be done in a convoluted way:
 - Bad news: additional efforts to substantiate the theory
 - Good news: opens doors to a number of control parameters

Ro-vibrational levels of molecules



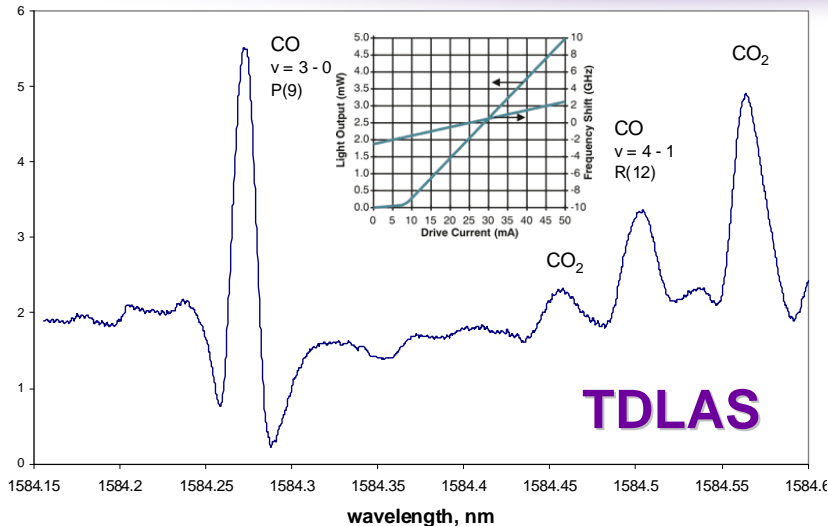
The relative population of two ro-vibrational levels and the temperature are related according to a certain law.

If we know the relative population, we can image the temperature.

Mid-IR species-specific resonances are difficult – “harmonics”?

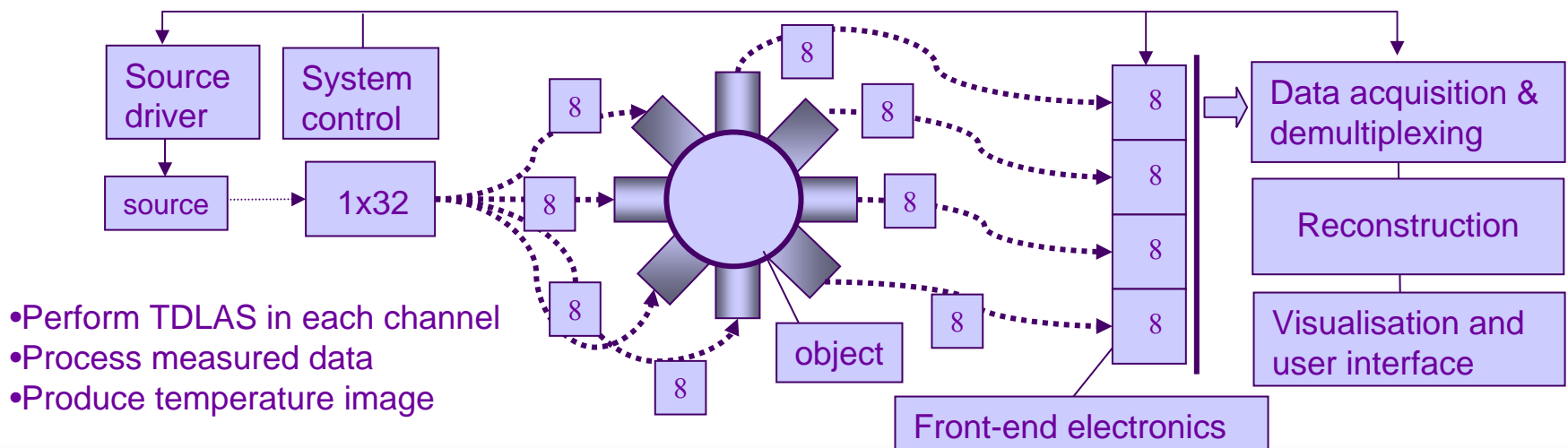
TTOMA system

Temperature Tomography by Molecular Absorption



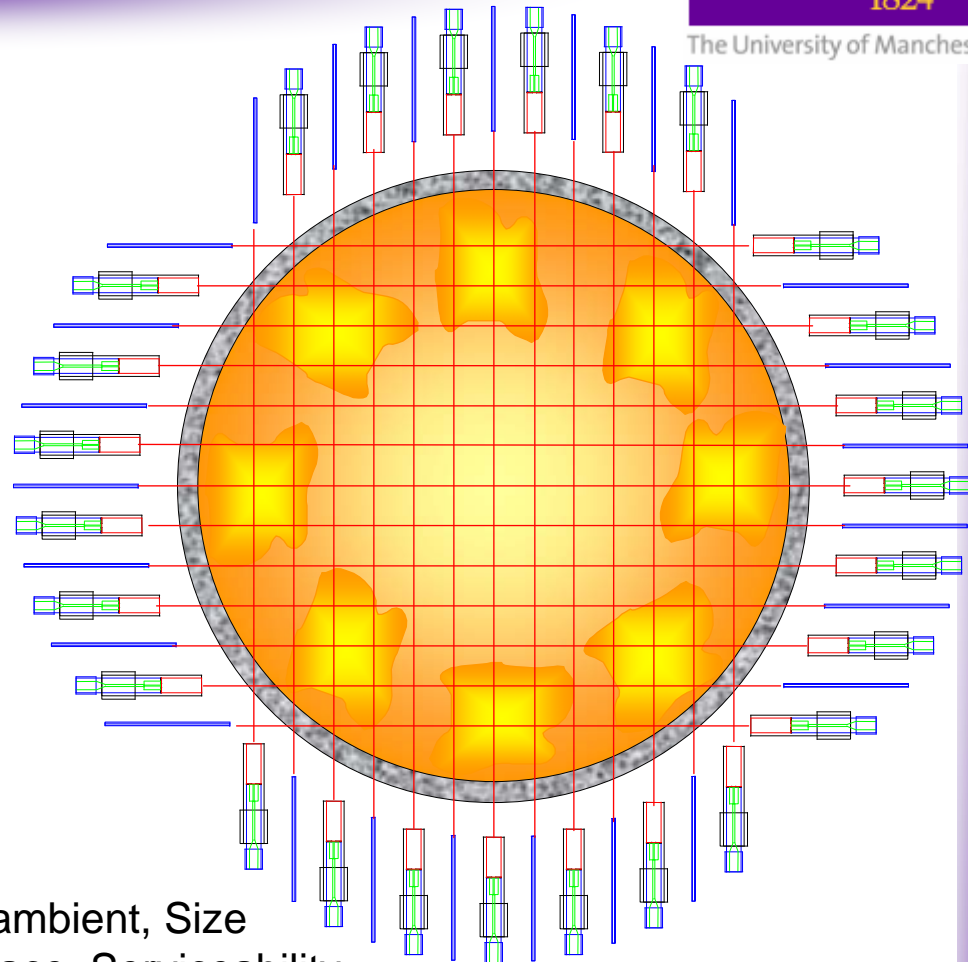
CO:

- fundamental at 4.6 μm sources, fibres, detectors - problematic
- first overtone at 2.3 μm sources, fibres, detectors - complicated
- second overtone at 1.58 μm sources, fibres, detectors - **easy and cheap (comms λ !!!)**



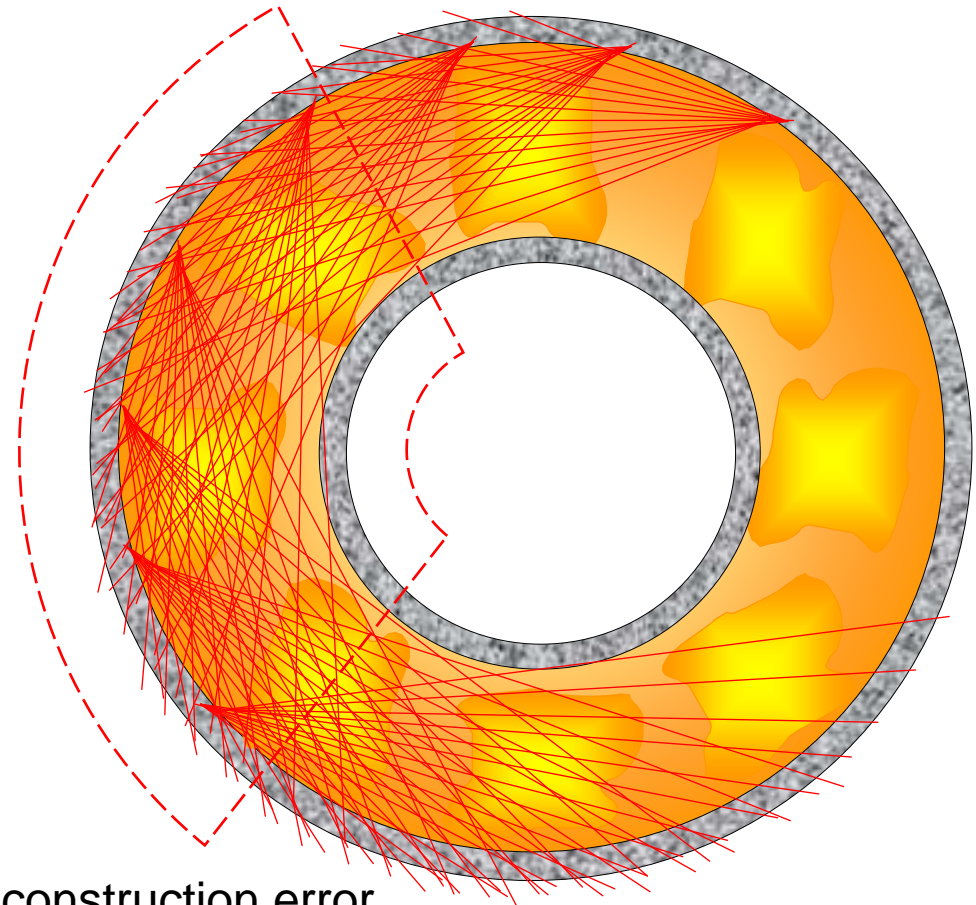
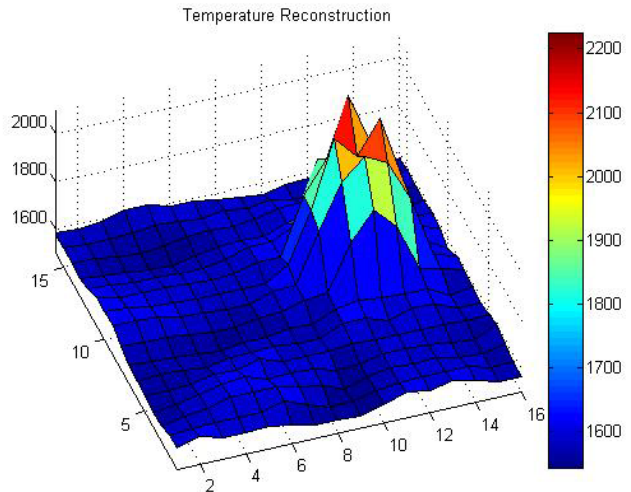
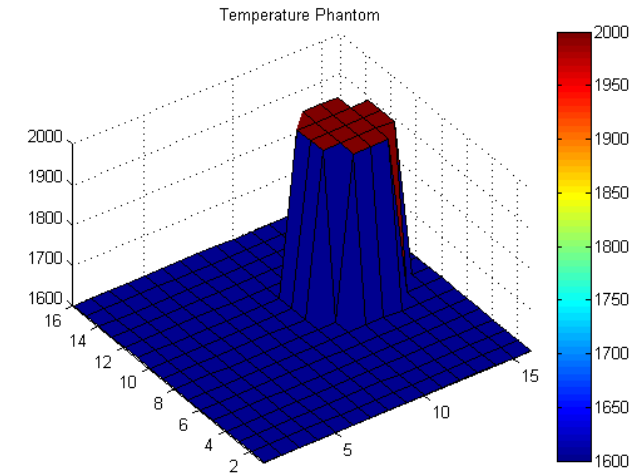
- Perform TDLAS in each channel
- Process measured data
- Produce temperature image

Access to objects - hostile environments



Hostile ambient, Size
Tight space, Serviceability
Alignment and calibration, Cost

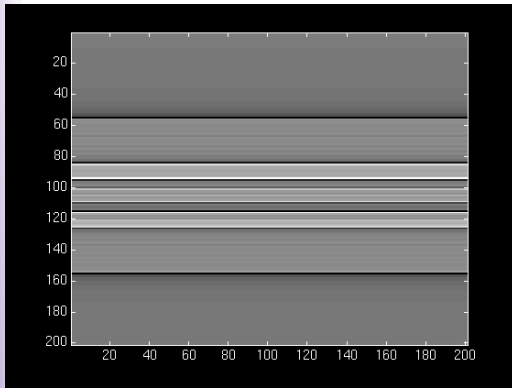
Temperature Tomography in turbines



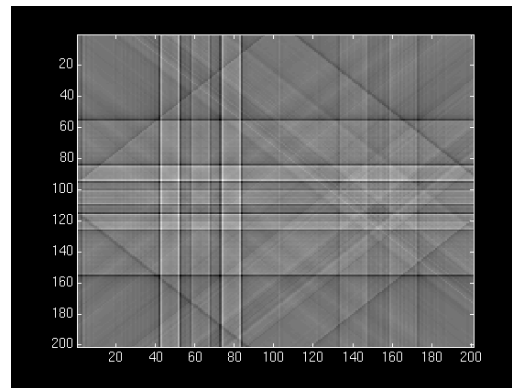
Reconstruction error
- about 17K at 2000K

Challenge 3: Insufficient data

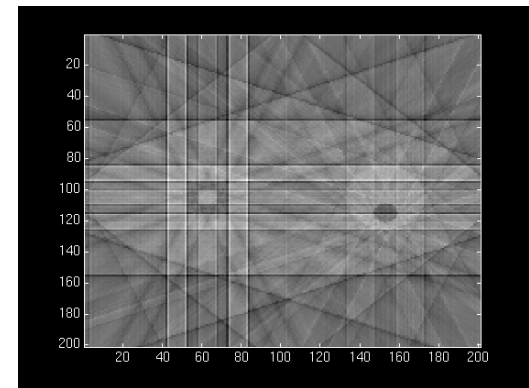
Phantom object reconstructed from 1, 4, 8, 15, and 60 filtered back projections.



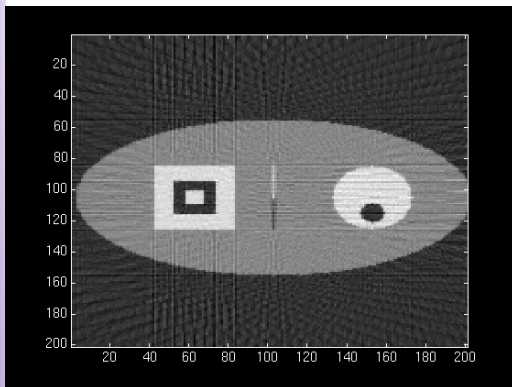
1



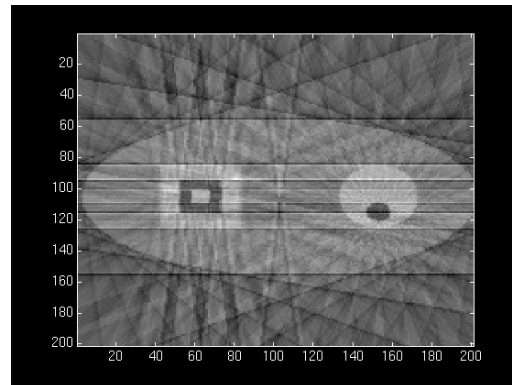
4



8

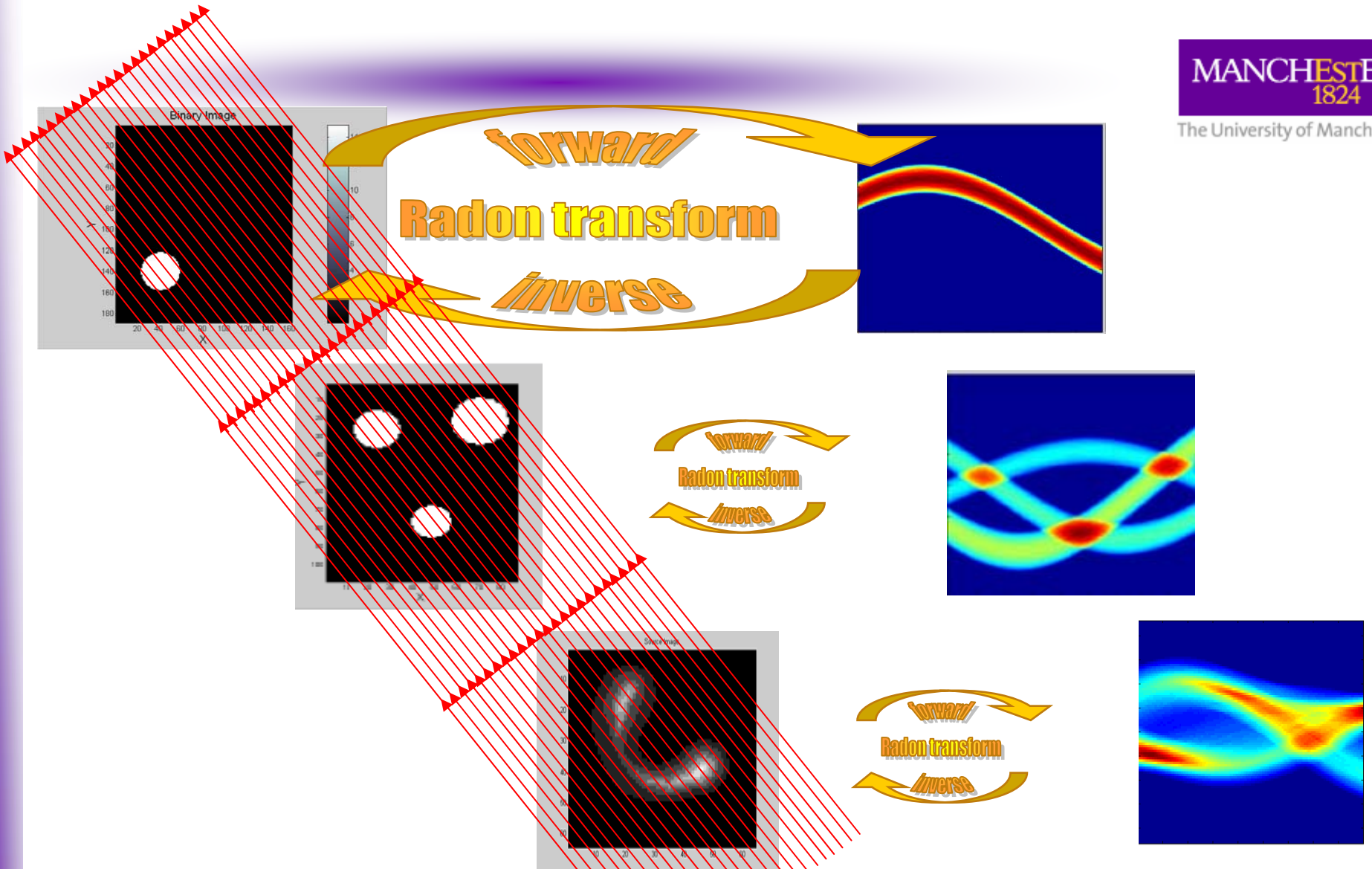


60

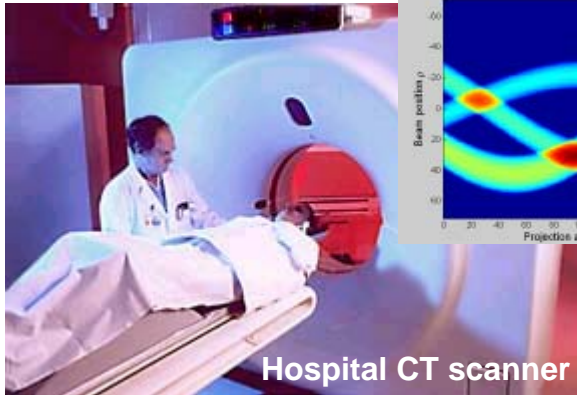


15

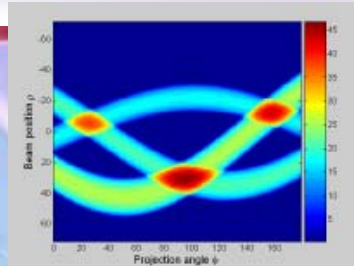
Sinograms of complex objects



Sparse and Limited Angle Tomography

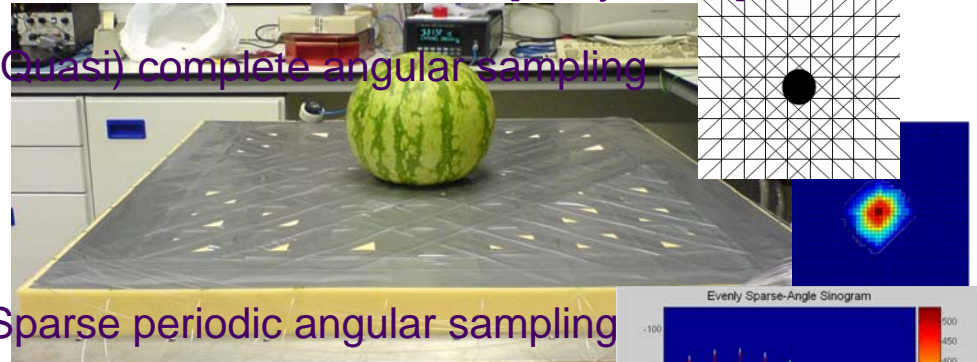


Hospital CT scanner

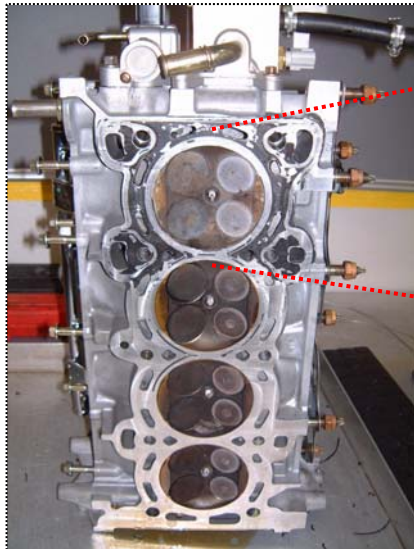
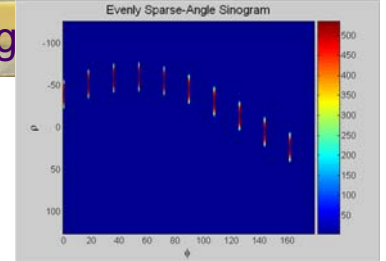


Photonic GPT, Manchester 2006 [Ozanyan et al.]

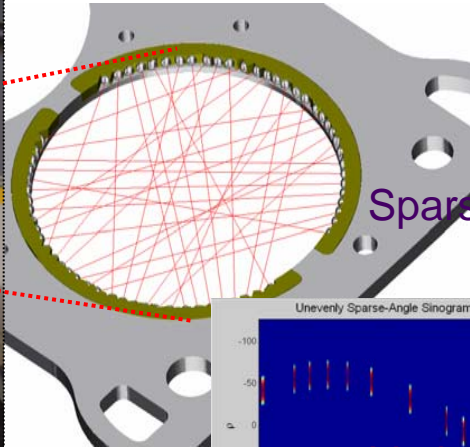
(Quasi) complete angular sampling



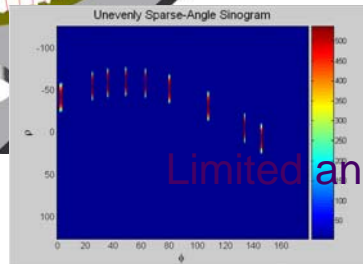
Sparse periodic angular sampling



IMAGER, Manchester 2002-2005 [McCann et al.]



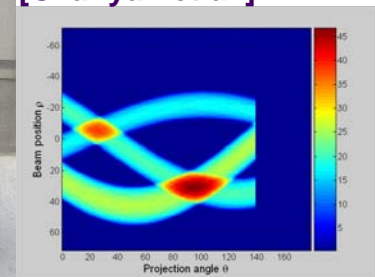
Sparse random angular sampling



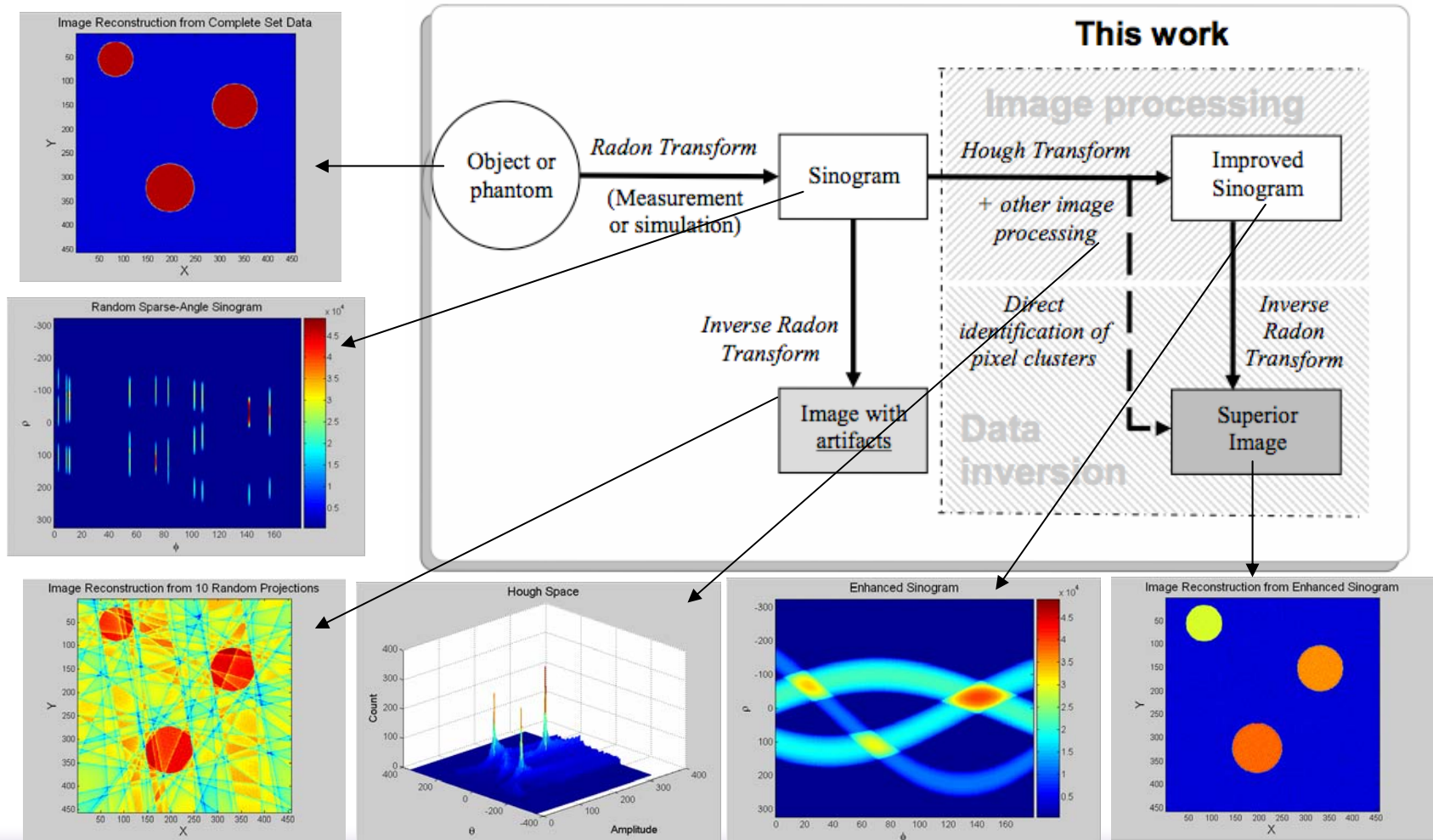
Limited angle sampling



OptoFluB, Manchester 2005 [Ozanyan et al.]



Suggested approach



Sinusoidal Hough Transform

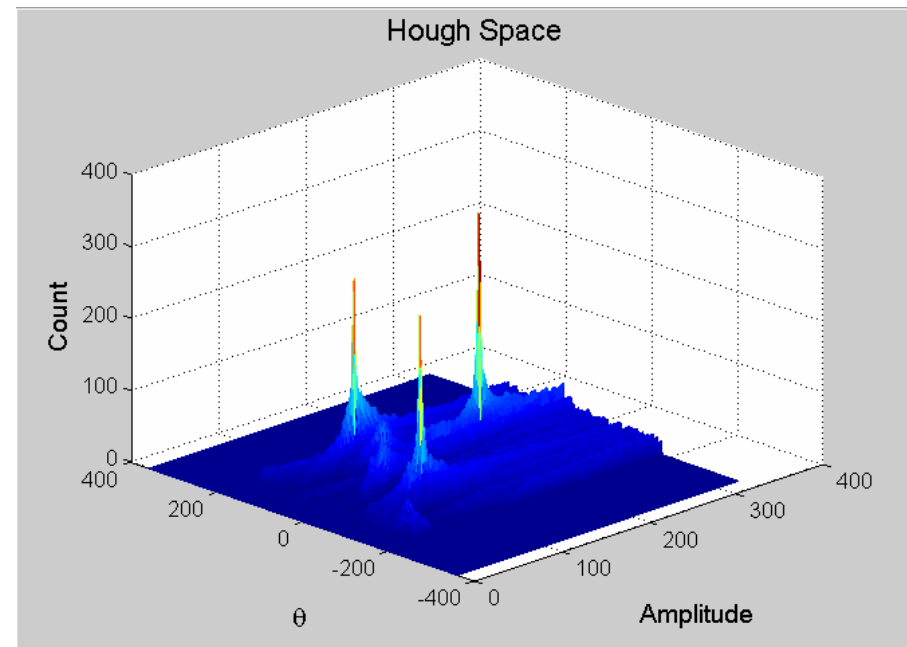
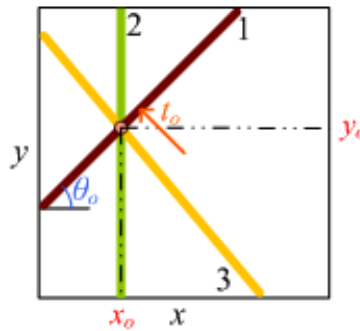
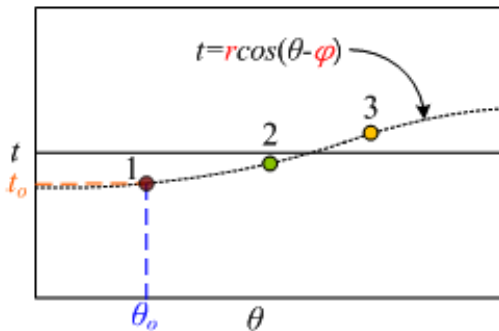
- Treat the sinogram as a pixellated image and identify sinusoidal patterns
- Use the analytical description of the patterns to calculate and fill in missing data
- Use that description for direct identification of higher intensity clusters

$$t = r \cos(\theta - \phi)$$

Only two variables, amplitude r and phase θ parameterise the curves which build the sinogram.

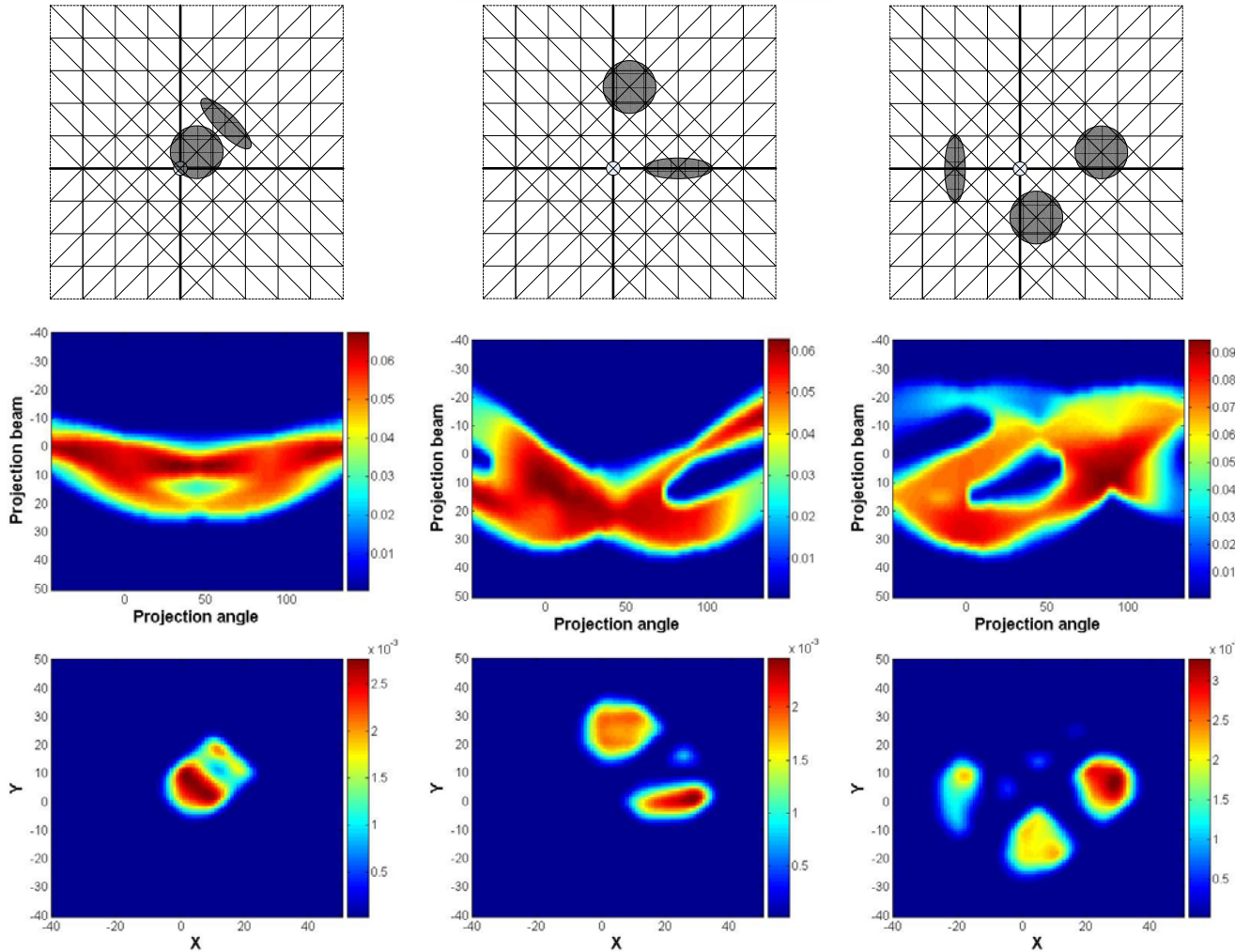
Or even better - in linear form:

$$y = -\frac{\cos\theta}{\sin\theta}x + \frac{t}{\sin\theta}$$



Sinogram recovery - complex objects

varying footprint
and position

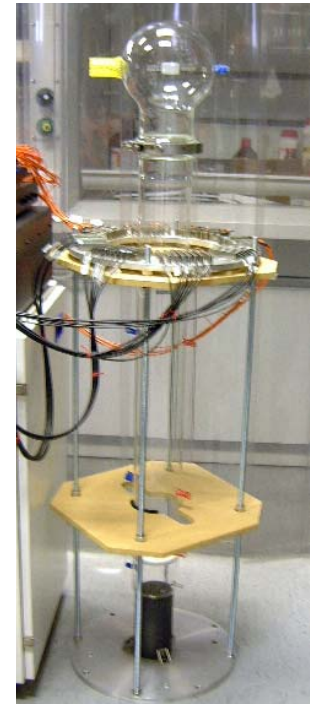
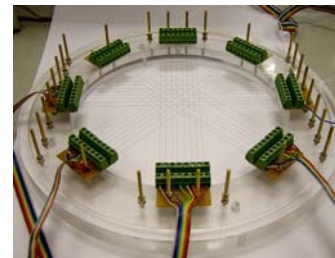
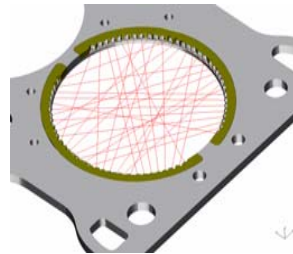
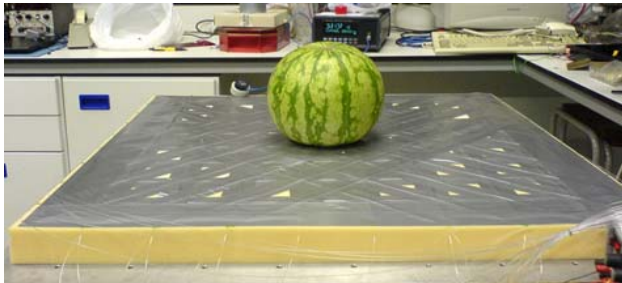


Challenge 4: Data acquisition and processing

Tomography requires multichannel signal processing, tailored to each individual case :

- Phase-sensitive detection (lock-in)
T-GPT, Optical, Electrical
- Balanced Ratiometric Detection
P-GPT, THz, Optical
- Photon counting
Optical CT, Diffuse Optical
- ...

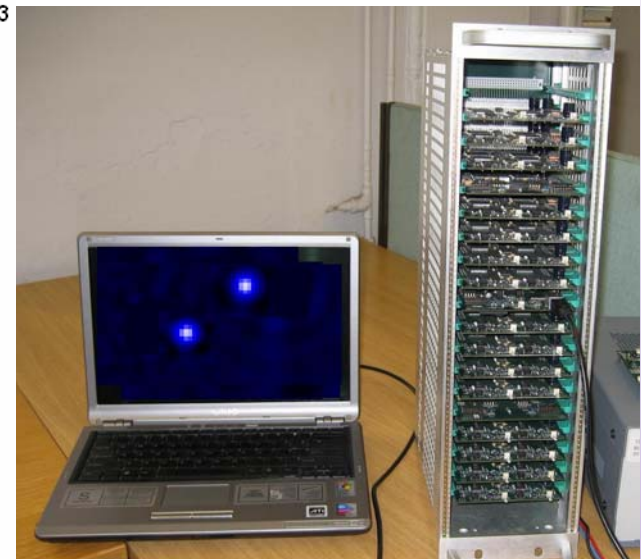
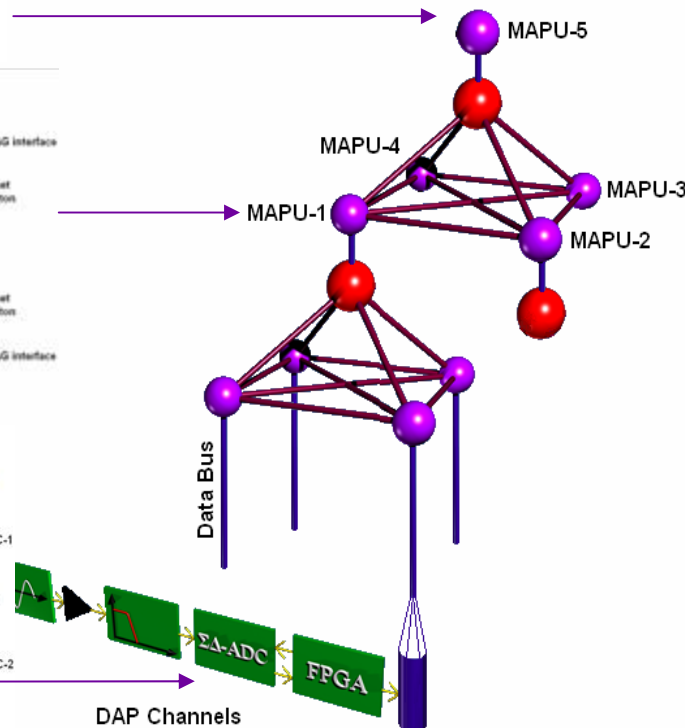
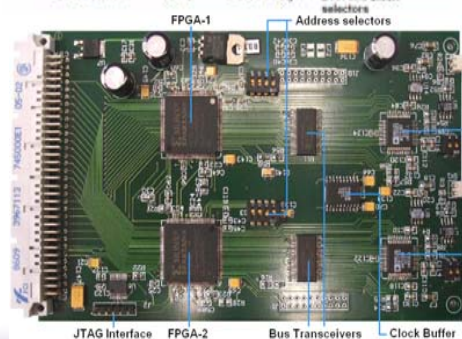
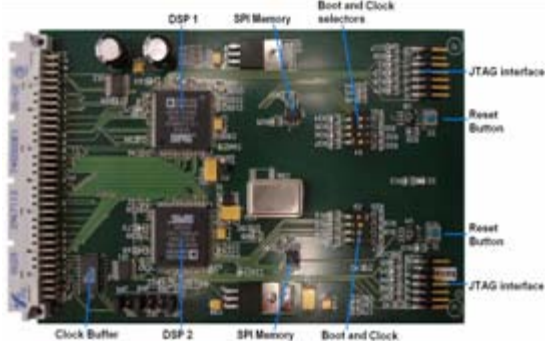
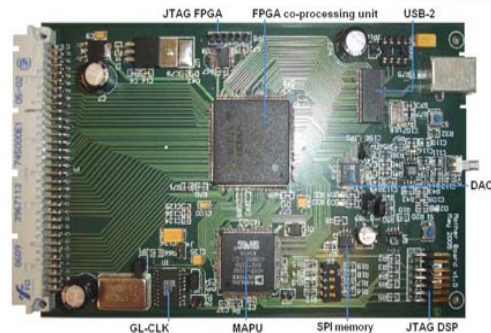
Can analog electronics provide a solution?



Challenge 4: Data acquisition and processing

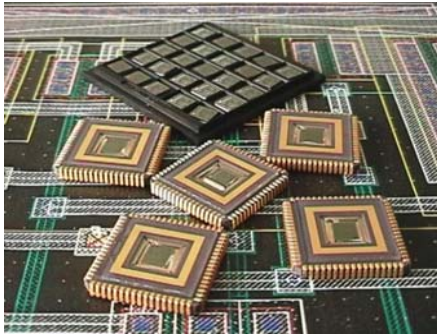
DSP/FPGA technology

- Massive parallel processing
- Expandable hierarchical architecture
- Accommodates a range of signal processing tasks

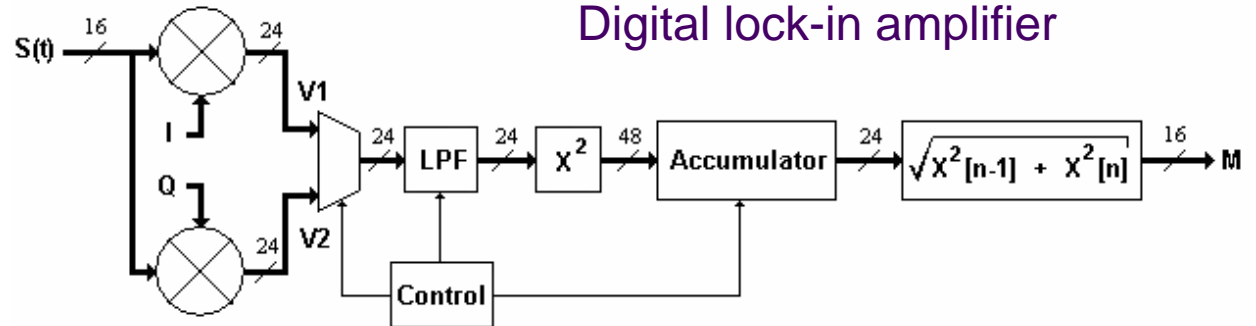


Signal processing algorithms

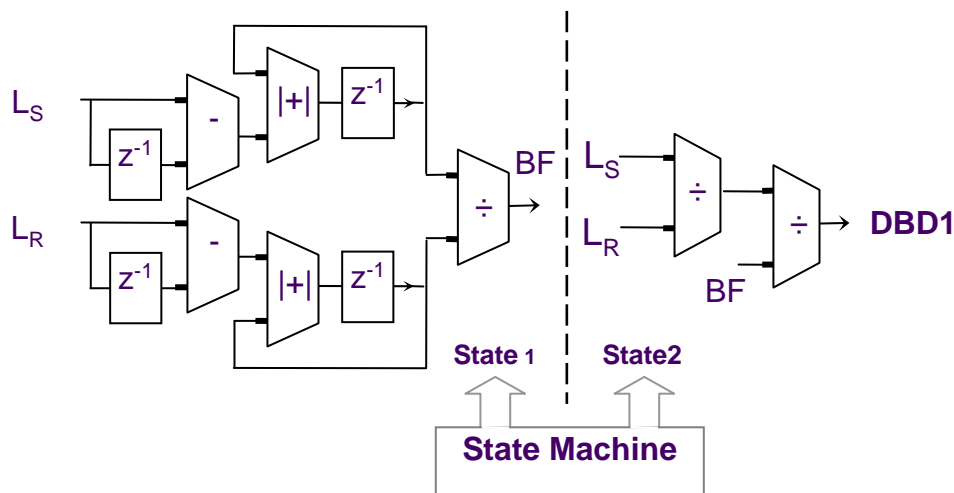
FPGA implementation



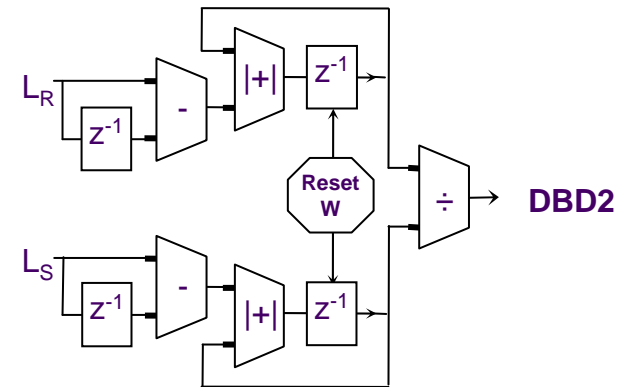
switch between algorithms
in real time



Digital lock-in amplifier



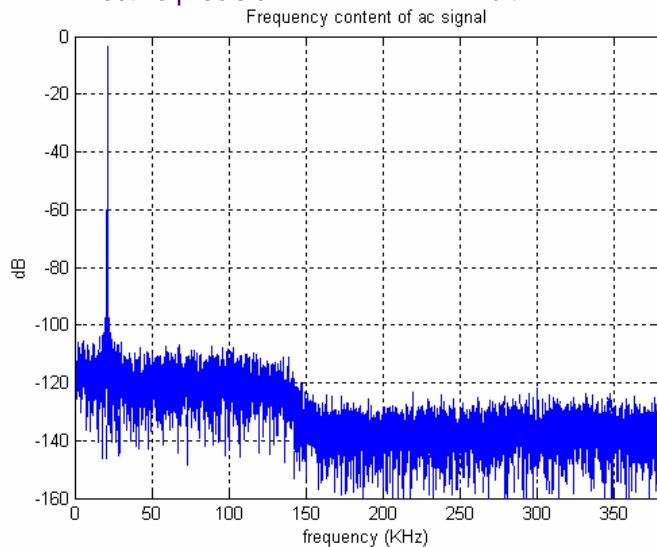
Digital balanced detector



Signal processing performance

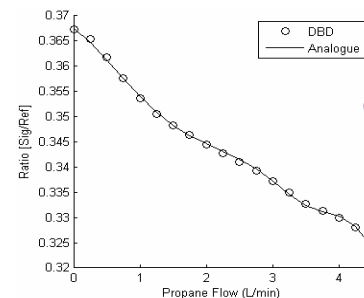
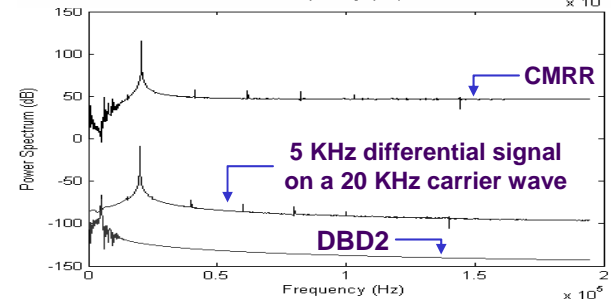
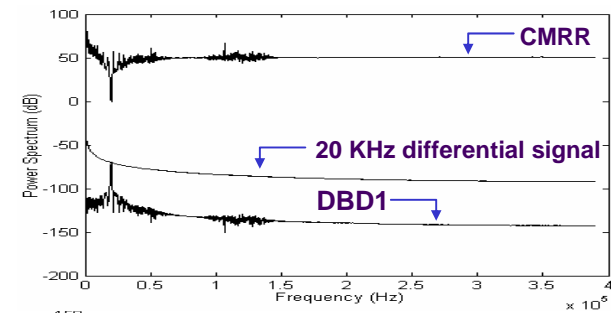
Digital lock-in amplifier

Analog signal sampling at	780 ksamples/s
Modulating frequency	180kHz
Bandwidth	50kHz
Stopband attenuation	98 dB (60 coef.)
Signal-to-noise	85 dB
Effective precision	14 bit



System throughput for 32 channels: ~200 Mbps

Digital balanced detector



Comparison between
Analog (NIRVANA)
and Digital BRD

Summary

- Applications of Tomography sensing and imaging in Industry
- Challenges and solutions in non-medical applications:
 - wavelength-sensitive modalities: IR, THz
 - path integrals: kinds of image contrast, T^0 -mapping
 - insufficient data: sinogram recovery from limited data
- Acknowledgments