

# Polychromatic Reconstruction for Talbot-Lau X-ray Tomography

**Florian Schiffers**, Sebastian Kaepler, Georg Pelzer, Andreas Wolf, Andreas Maier, Gisela Anton and Christian Riess



**P**ATTERN  
**R**ECOGNITION  
**L**AB



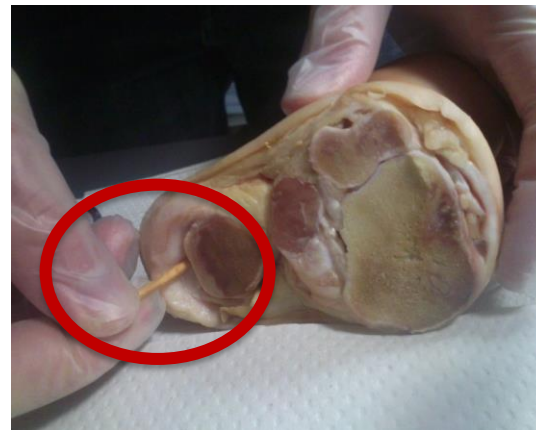
**ERLANGEN CENTRE  
FOR ASTROPARTICLE  
PHYSICS**

## Wooden splinter in pig foot

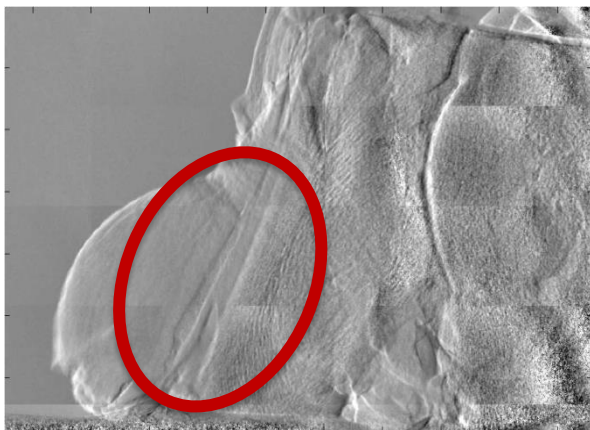
J. Rieger *et al.*: "Optimization procedure for a Talbot-Lau x-ray phase-contrast imaging system", 2017.



Absorption



Optical image

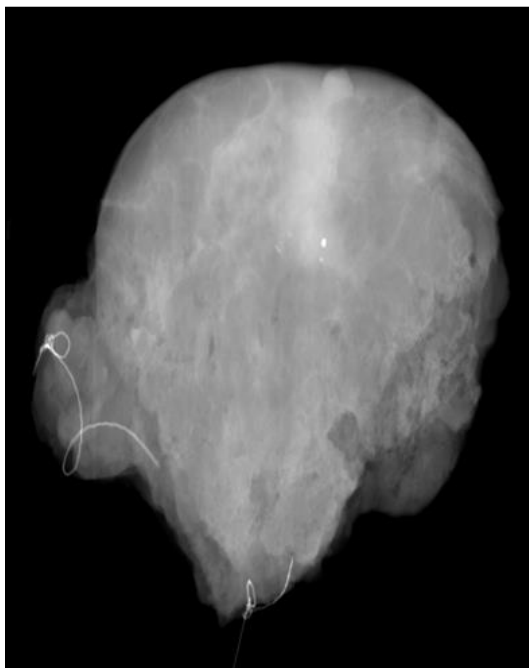


Diff. Phase

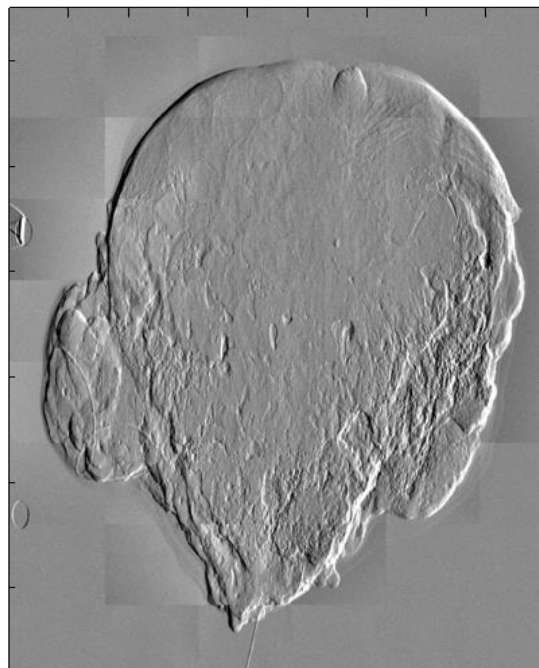


Dark-Field

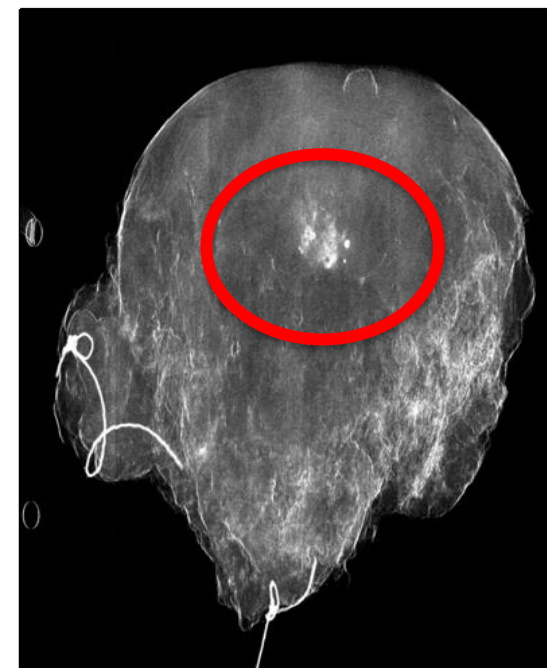
## Mammography: micrometer-sized calcifications



Absorption



Diff. Phase



Dark-Field

T. Michel *et al.*: "On a dark-field signal generated by micrometer-sized calcifications in phase-contrast mammography", 2013.

## Human knee

F. Horn *et al.*: “High-energy x-ray grating-based phase-contrast radiography of human anatomy”, 2016.



Absorption



Diff. Phase



Dark-Field



# Human knee

F. Horn *et al.*: “High-energy x-ray grating-based phase-contrast radiography of human anatomy”, 2016.



Absorption



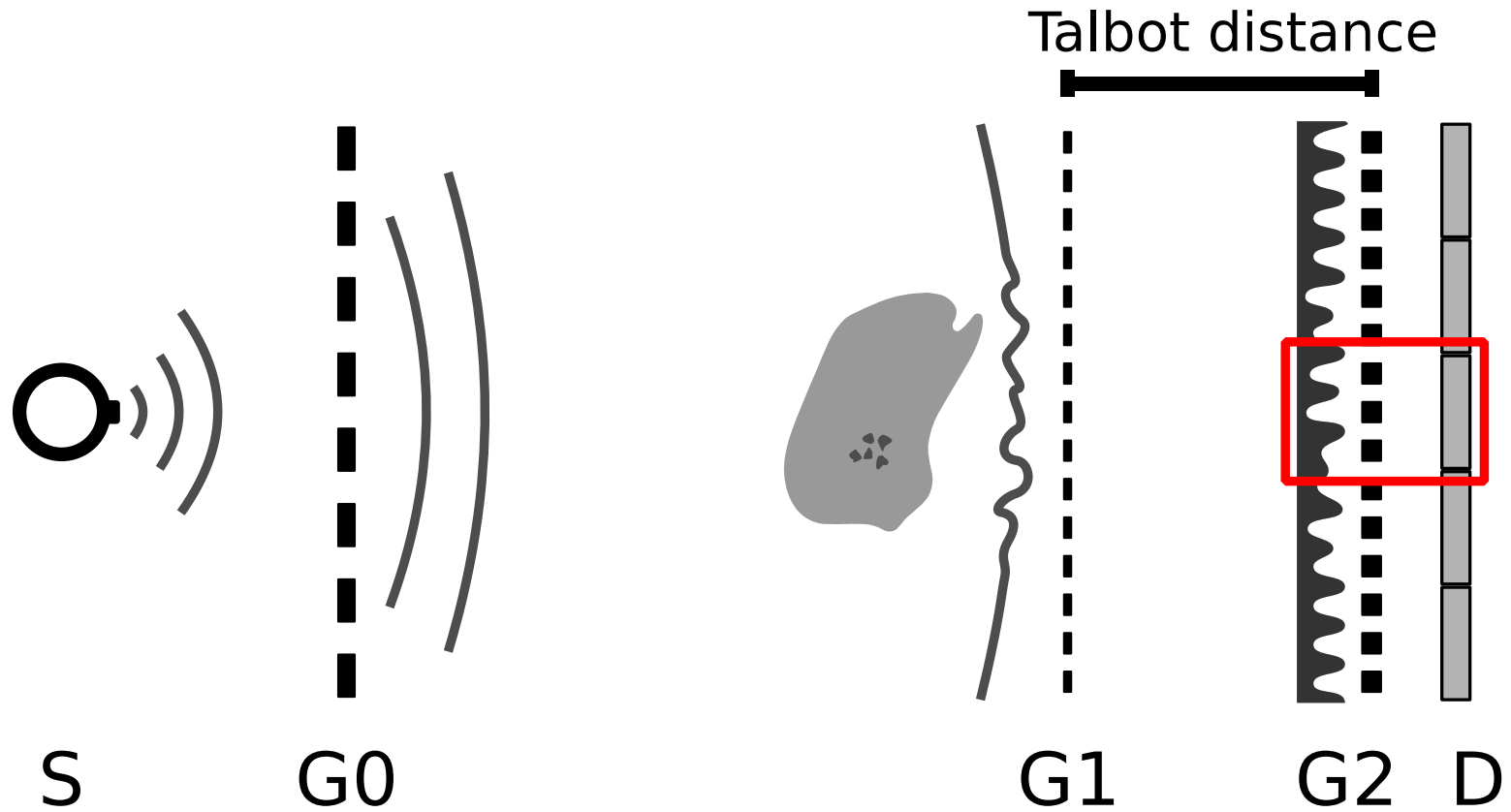
Diff. Phase



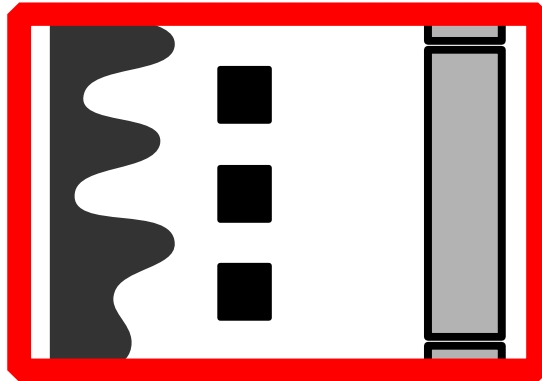
**chondrocalcinosis**

Dark-Field

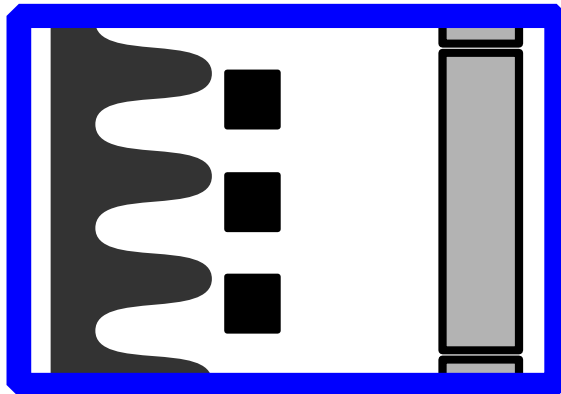
# Talbot-Lau X-ray Imaging



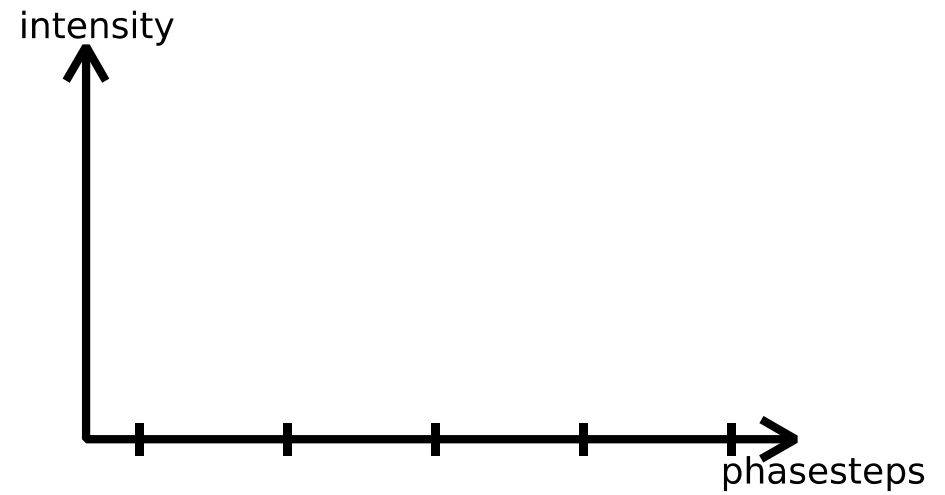
# Phase stepping



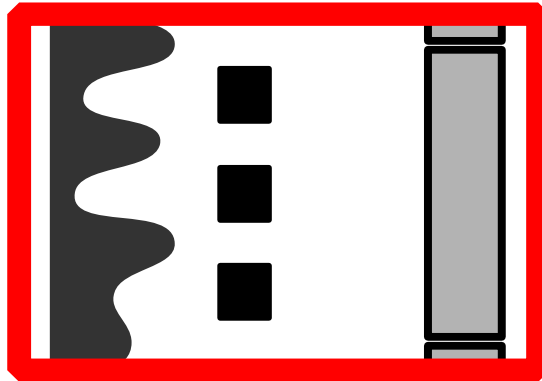
Object



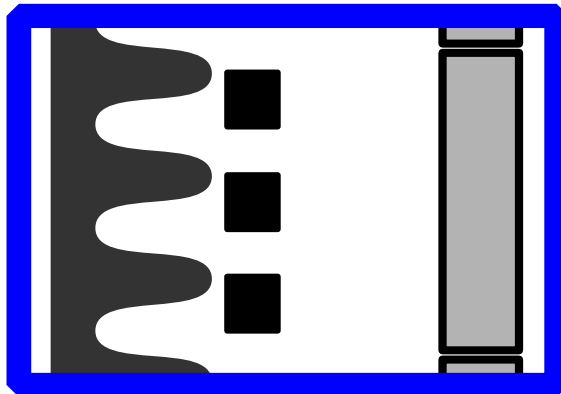
Reference



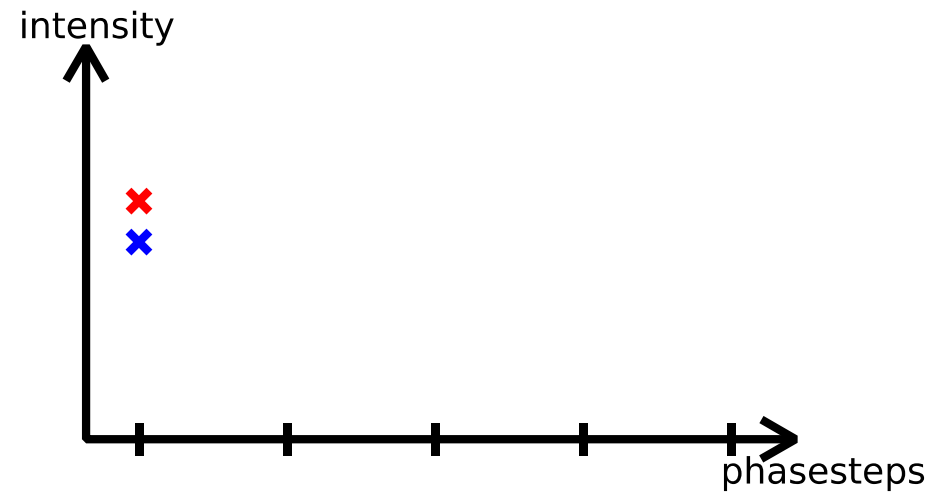
# Phase stepping



Object

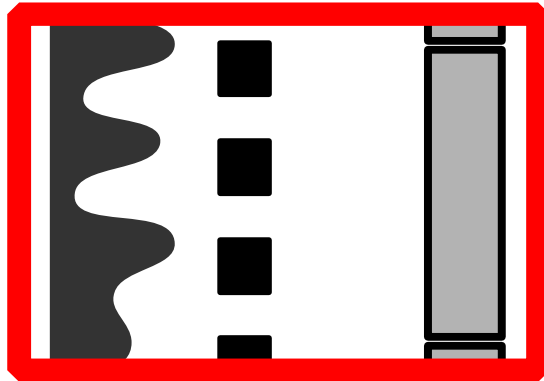


Reference

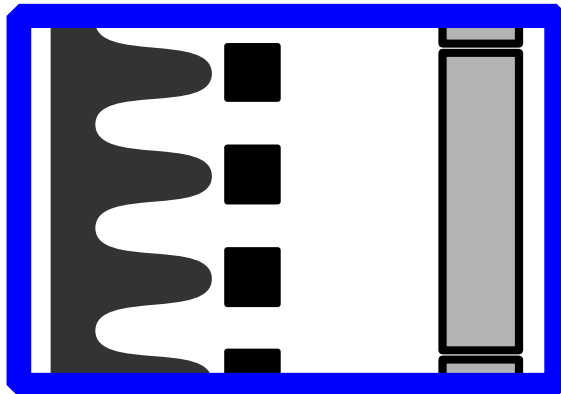




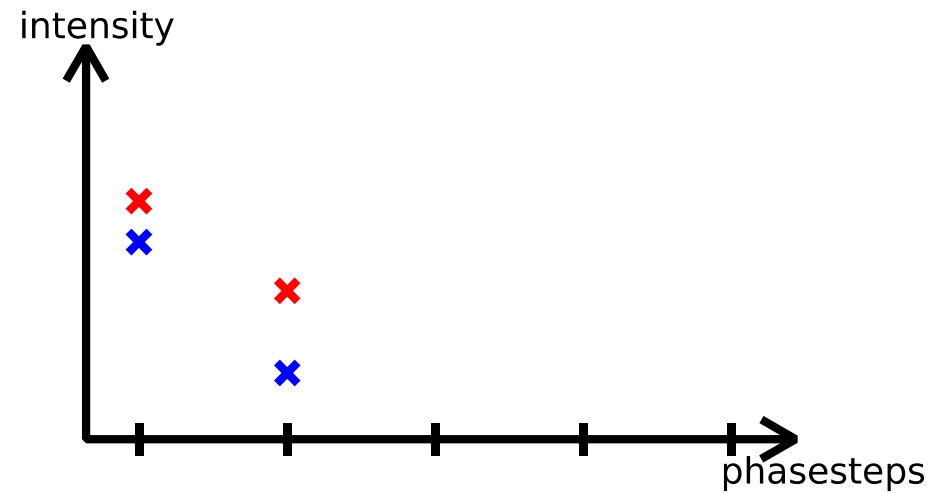
# Phase stepping



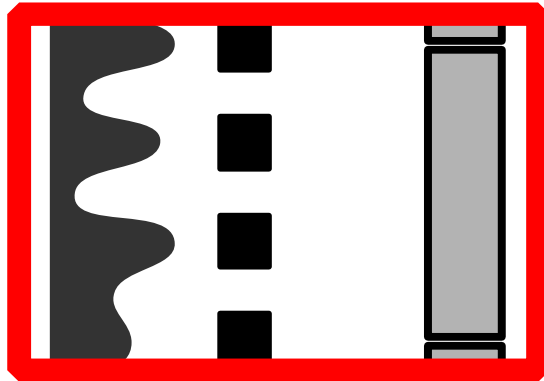
Object



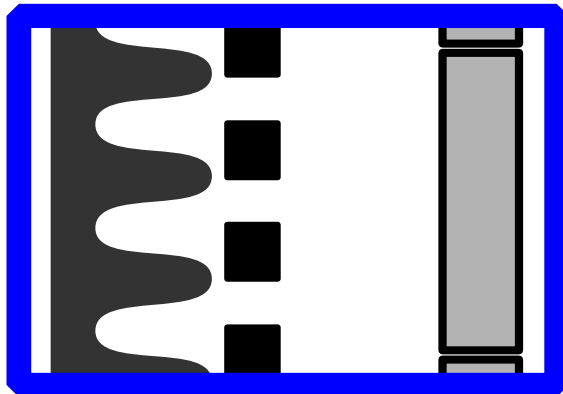
Reference



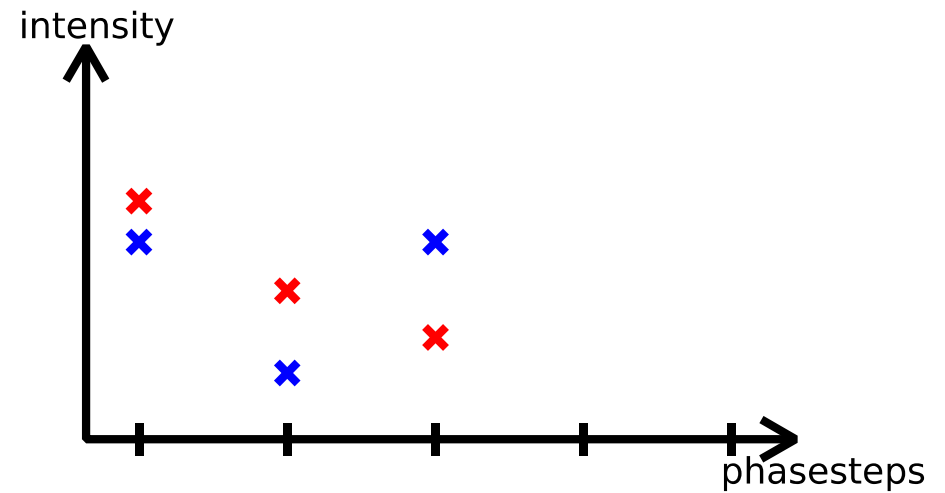
# Phase stepping



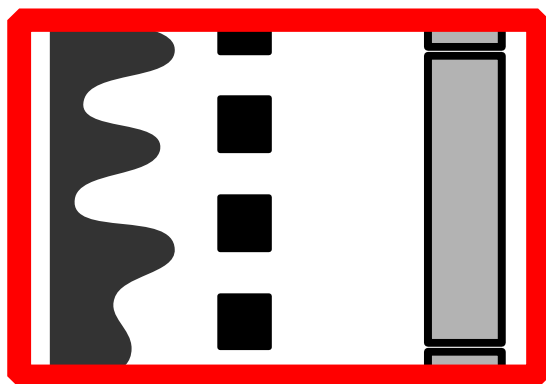
Object



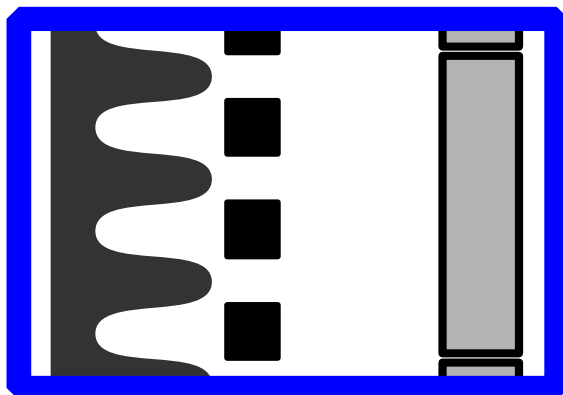
Reference



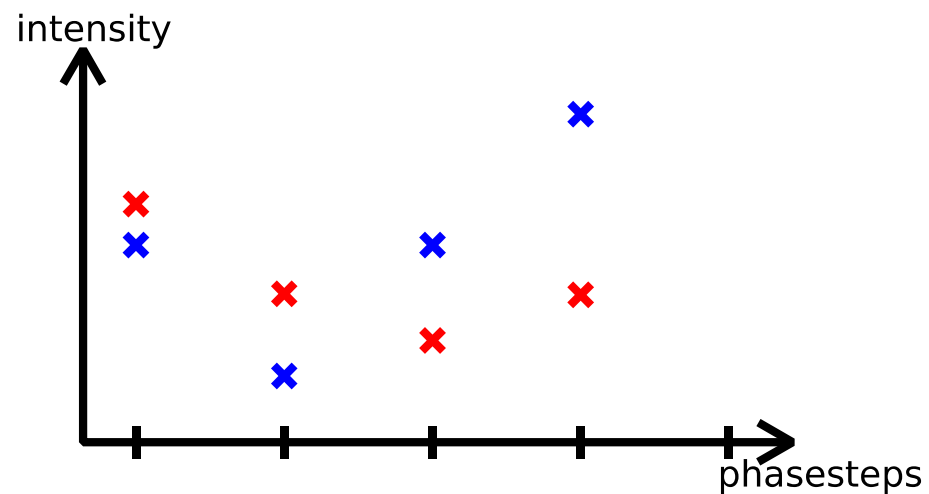
## Phase stepping



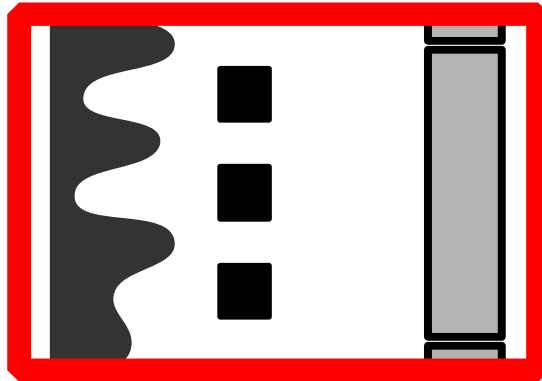
Object



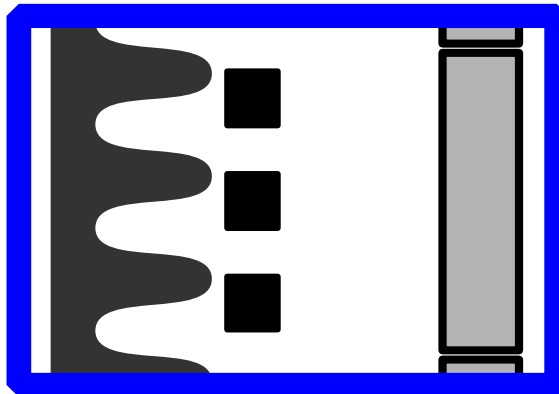
Reference



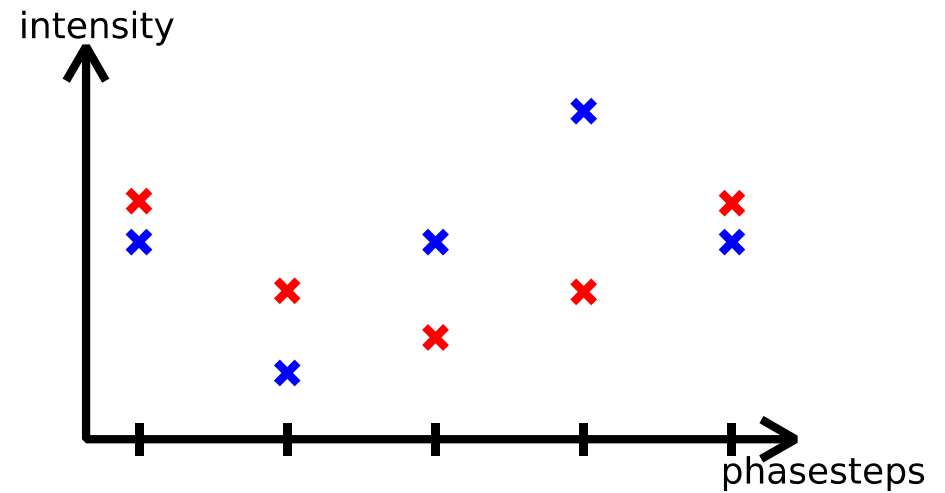
# Phase stepping



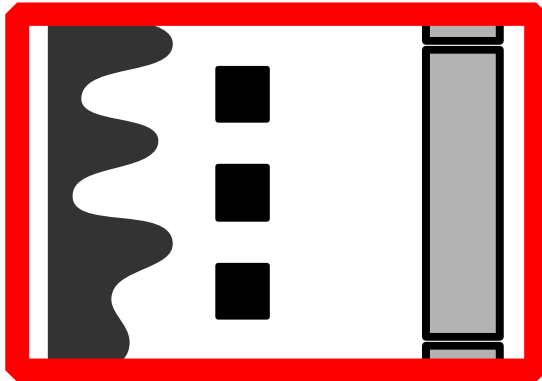
Object



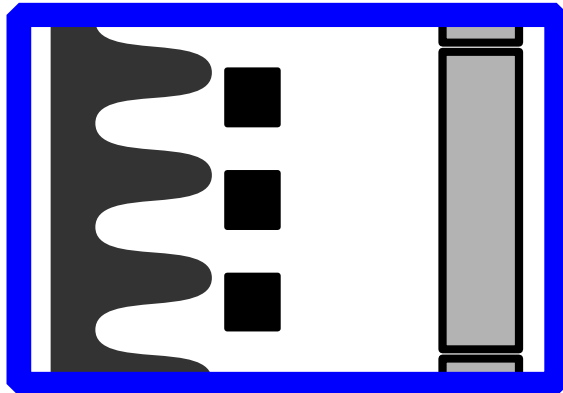
Reference



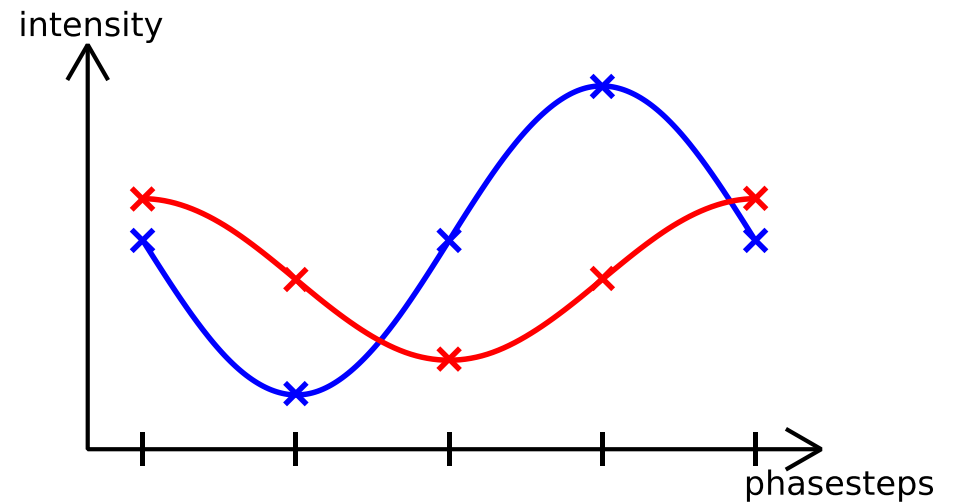
# Parameter fitting



Object

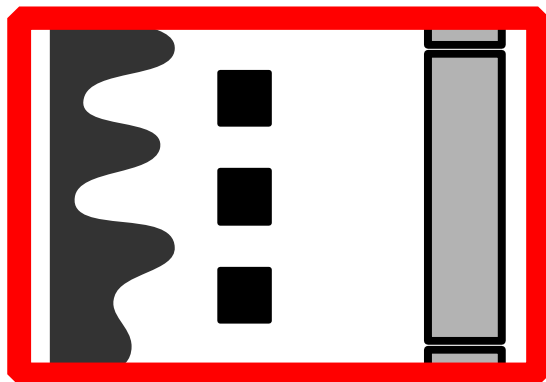


Reference

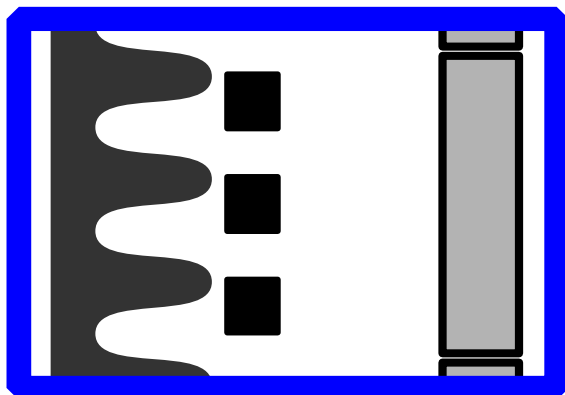




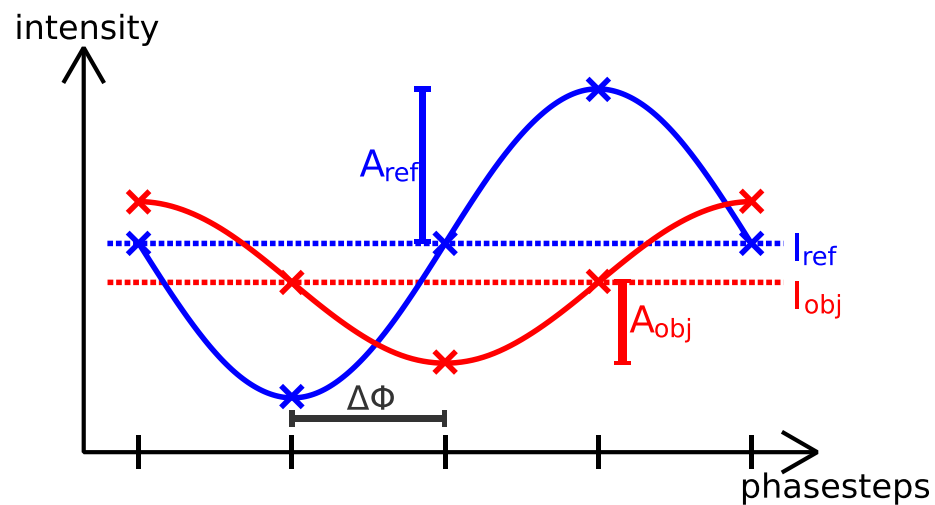
# Parameter fitting



Object



Reference





# Information retrieval

Attenuation

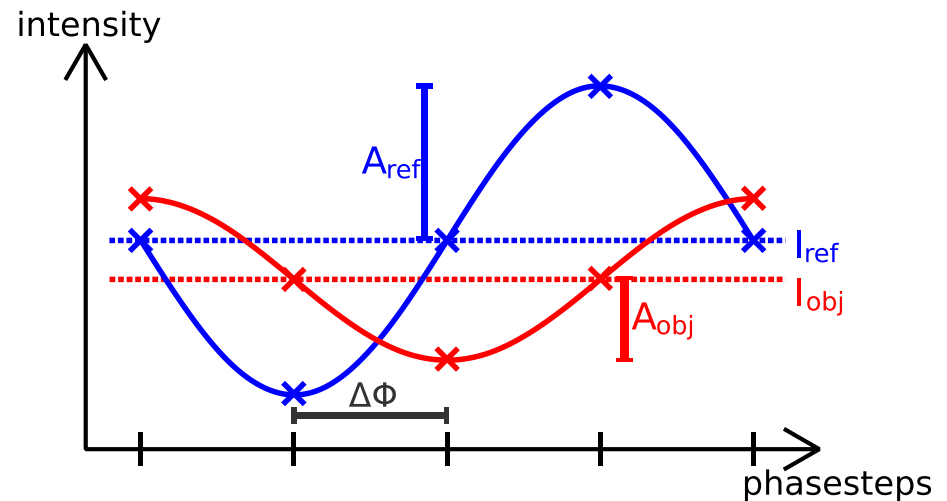
$$T = \frac{I_{obj}}{I_{ref}}$$

Differential phase

$$\Delta\Phi = \Phi_{ref} - \Phi_{obj}$$

Dark-field

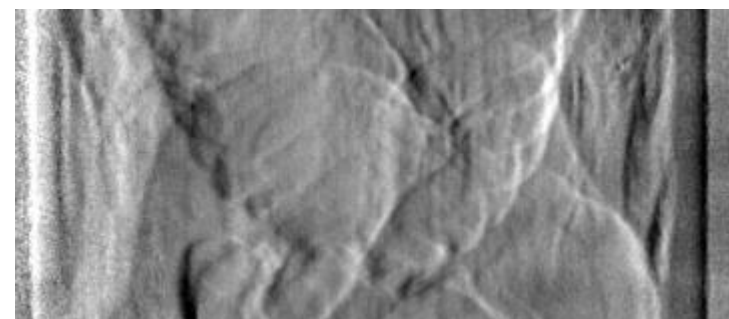
$$D = \frac{V_{obj}}{V_{ref}} = \frac{A_{obj}}{I_{obj}} \cdot \frac{I_{ref}}{A_{ref}}$$



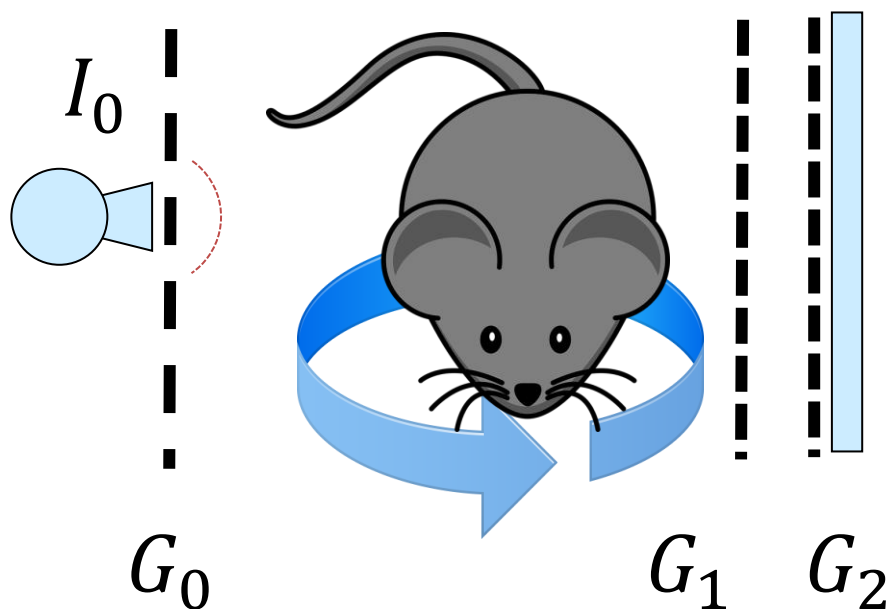
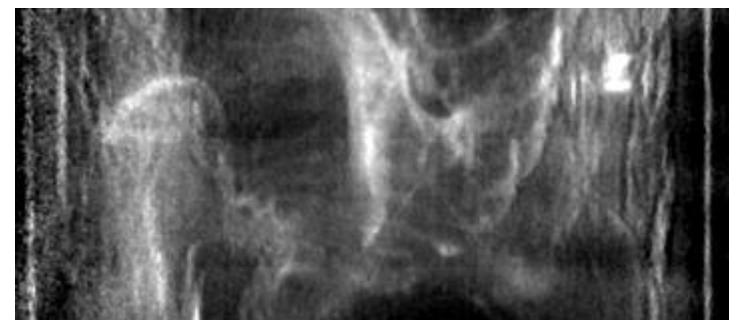
# Attenuation



## Differential Phase

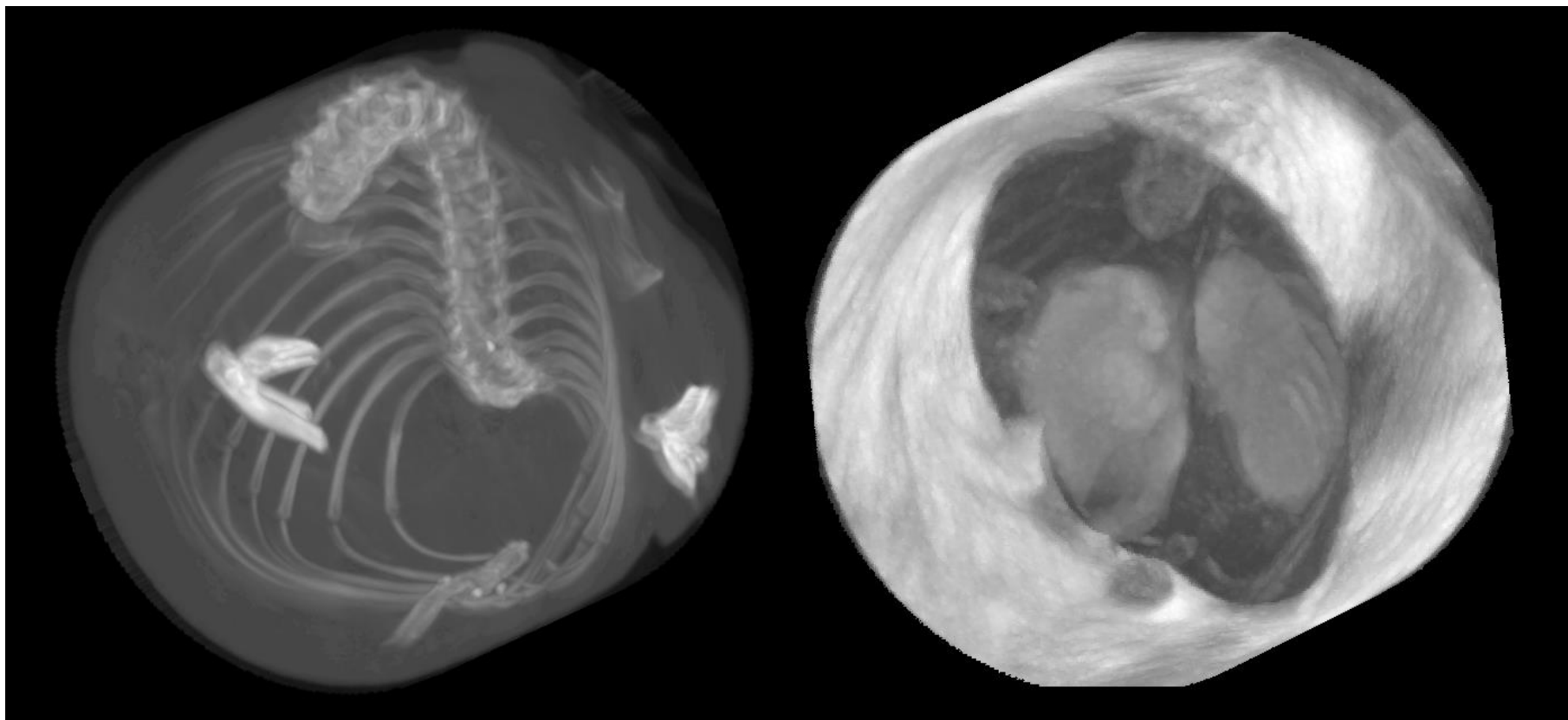


## Dark-field



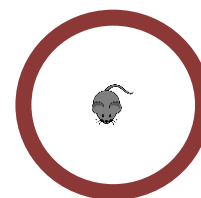
# Attenuation

# Scatter



## Polychromatic imaging of larger objects

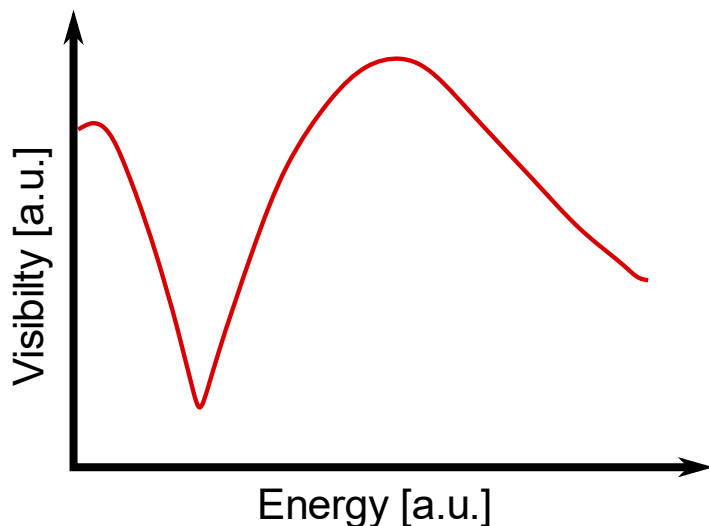
- Beam hardening leads to artifacts in attenuation CT
  - Cupping and streak artifacts
  - Reason: energy dependent attenuation coefficients
- Talbot-Lau interferometry
  - Energy dependent refraction and scattering
  - Other energy dependencies:
    - reference phase
    - reference visibility



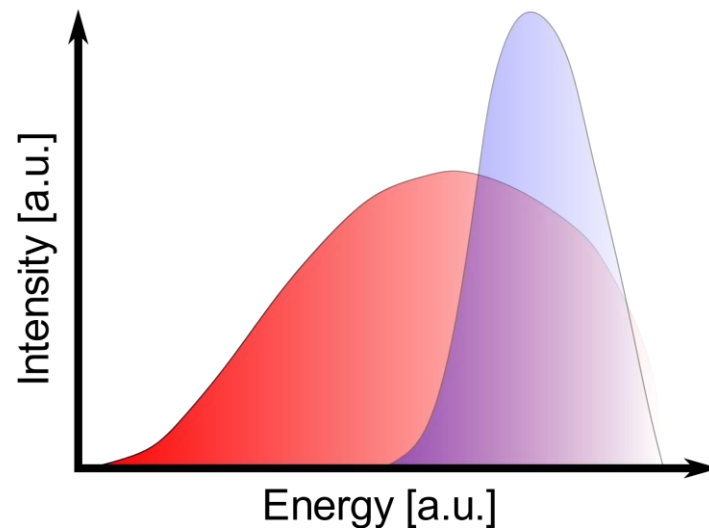


## Dark-field due to beam hardening

- Visibility  $V$ : Energy dependent contrast
- Dark-field Image: Loss of visibility due to object scattering
- BUT: Can be due to beam hardening



Energy dependent contrast



X-ray Spectrum w/ and w/o  
beam hardening



# Polychromatic Model for Iterative Reconstruction

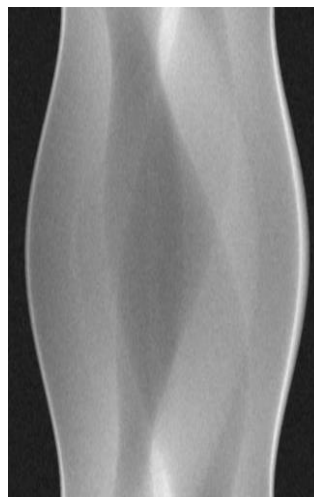
- Iterative reconstruction beneficial for Talbot/Lau imaging
  - Implicit modelling of noise
  - Allows flexible acquisitions
  - Avoids phase retrieval which can lead to complex noise statistics
- **This work:** polychromatic forward model for statistical iterative reconstruction

# Iterative reconstruction

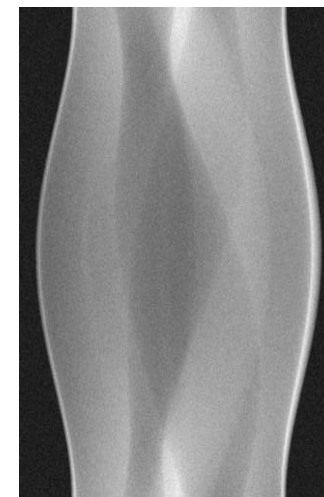
Forward model



Reco



Estimation

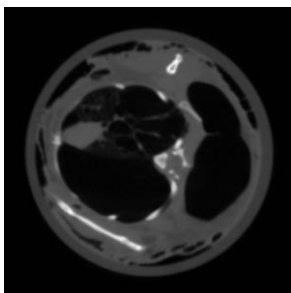


Measurement

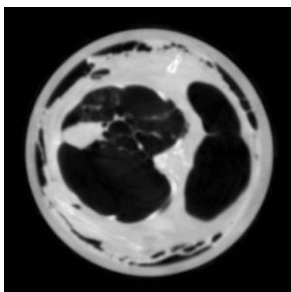


Update

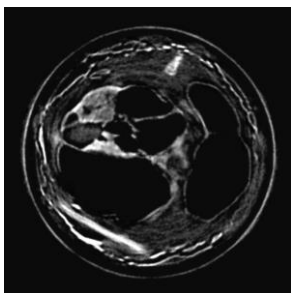
## Attenuation



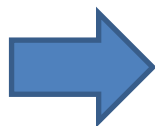
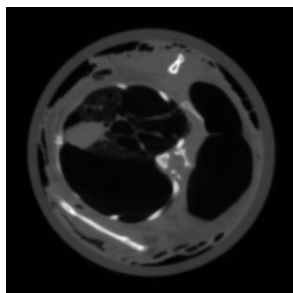
## Refractive decrement



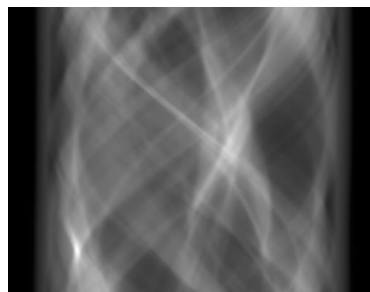
## Scatter



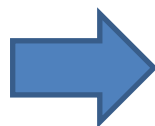
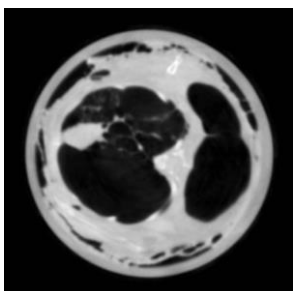
Attenuation



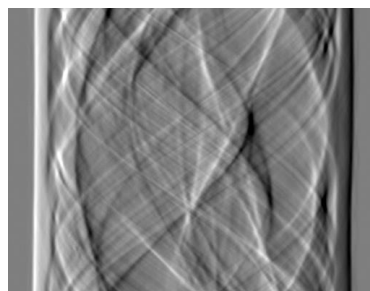
Transmission



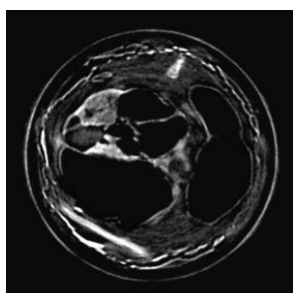
Refractive decrement



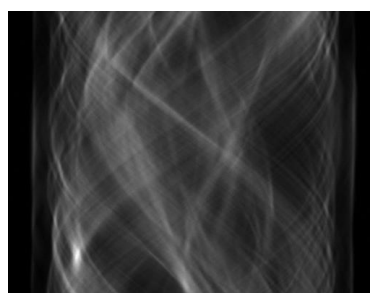
Diff. phase



Scatter



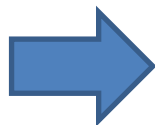
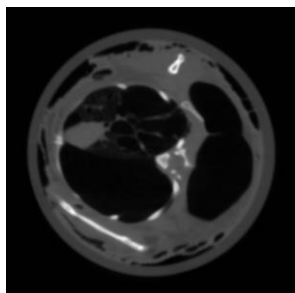
Dark-field



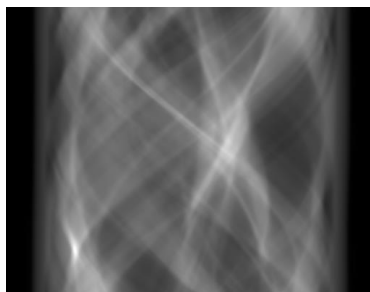




Attenuation



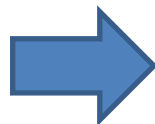
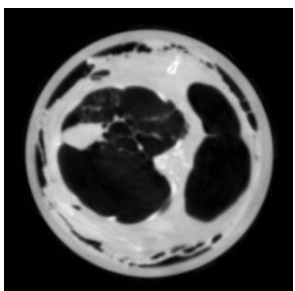
Transmission



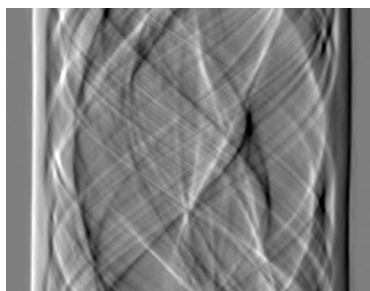
Phase  
Step 1



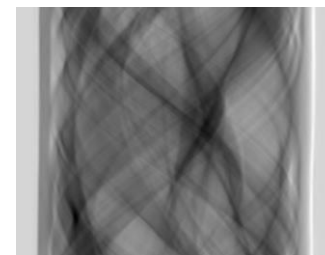
Refractive decrement



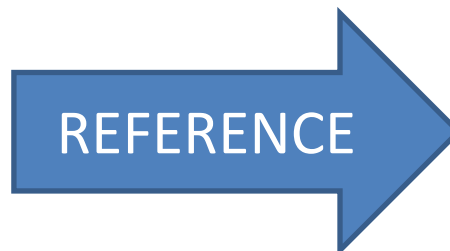
Diff. phase



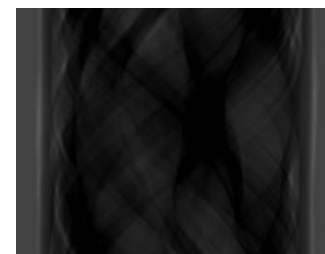
Phase  
Step 2



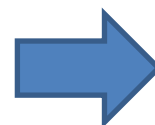
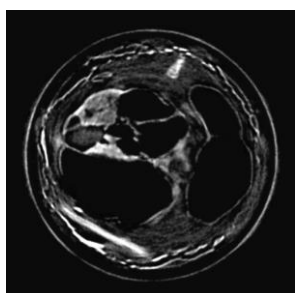
REFERENCE



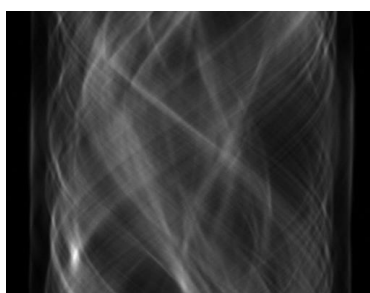
Phase  
Step 3



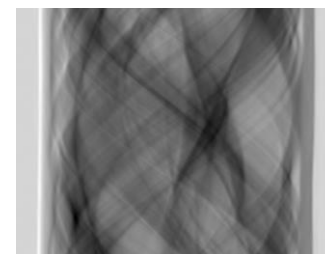
Scatter



Dark-field



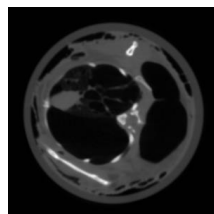
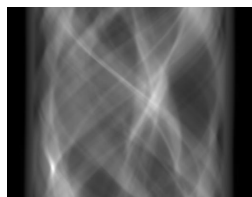
Phase  
Step 4



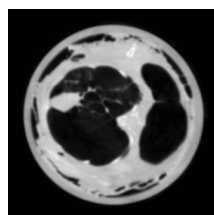
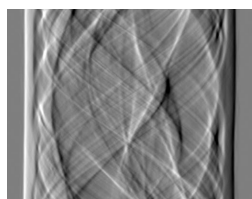
## Conventional CT

Sinogram data

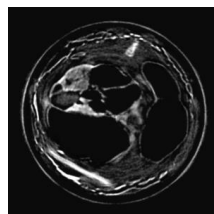
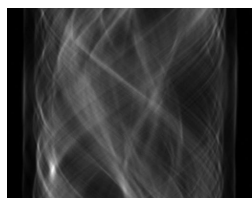
Transmission



Diff. phase



Dark-field



vs.

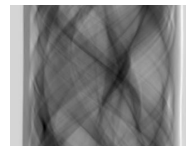
## Talbot Lau CT

Phase stepping data

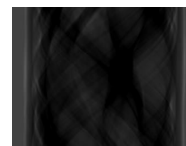
Phase step 1



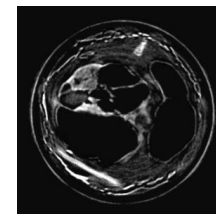
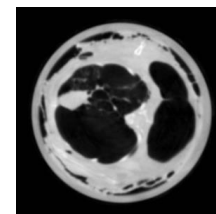
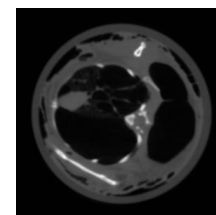
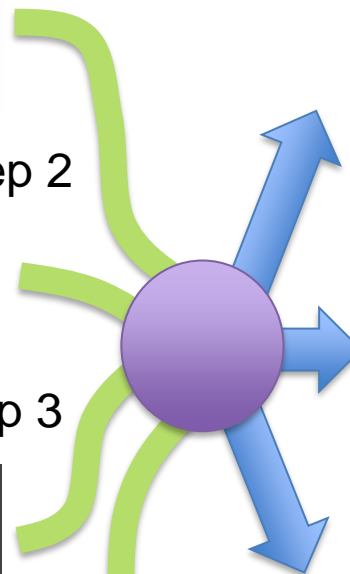
Phase step 2



Phase step 3



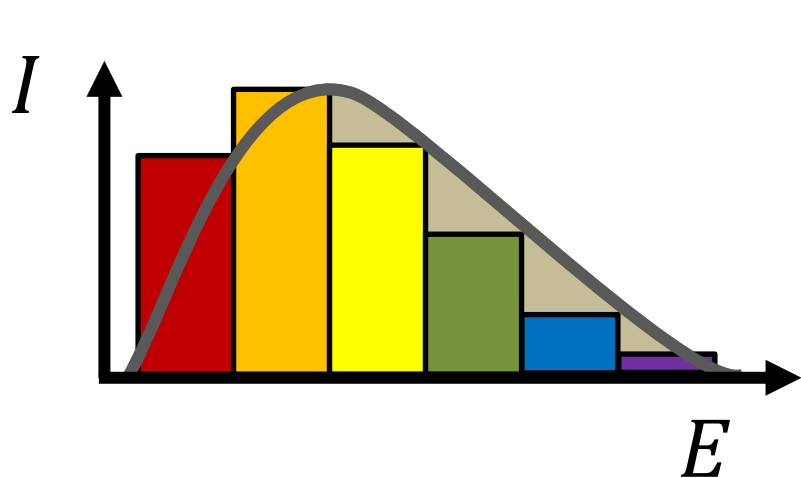
Phase step 4





# From monochromatic to polychromatic

# Polychromatic Forward Model



$$\mu(E) = \mu(E_0) \cdot \left(\frac{E}{E_0}\right)^{c_{\mu} \approx -3}$$

$$\delta(E) = \delta(E_0) \cdot \left(\frac{E}{E_0}\right)^{c_{\delta} = -2}$$

$$\sigma(E) = \sigma(E_0) \cdot \left(\frac{E}{E_0}\right)^{c_{\sigma} \approx -3}$$

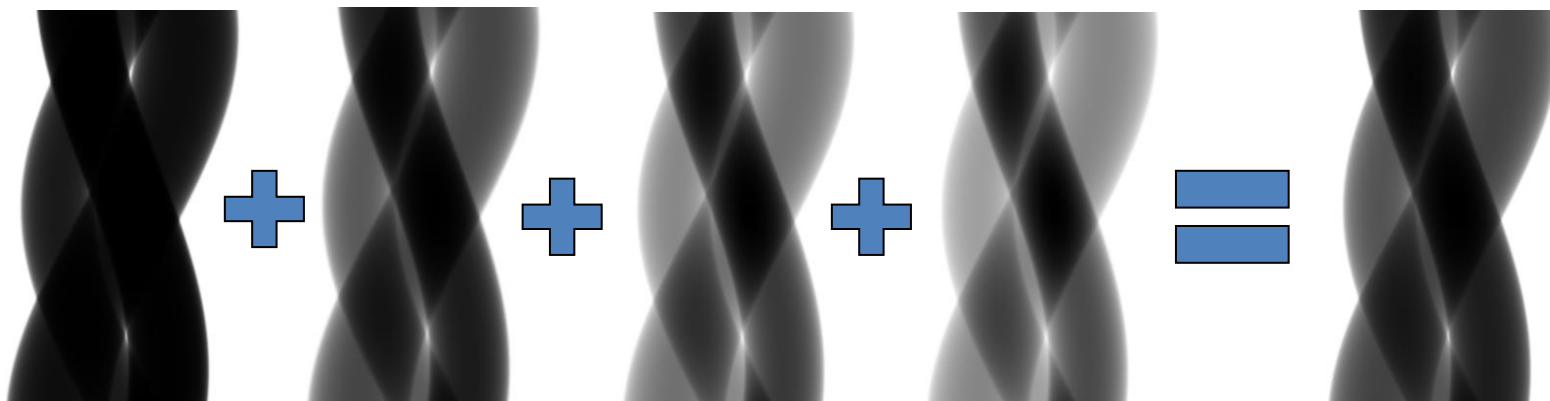
15 keV

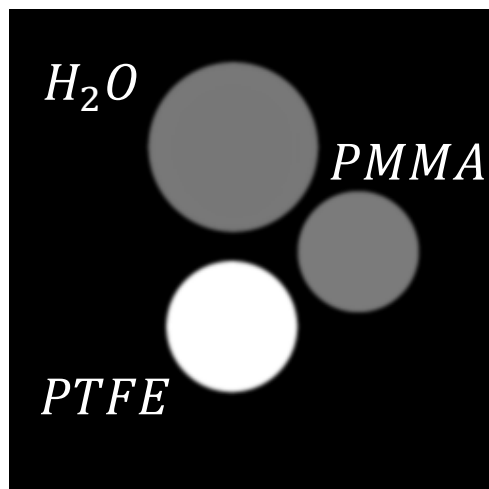
20 keV

...

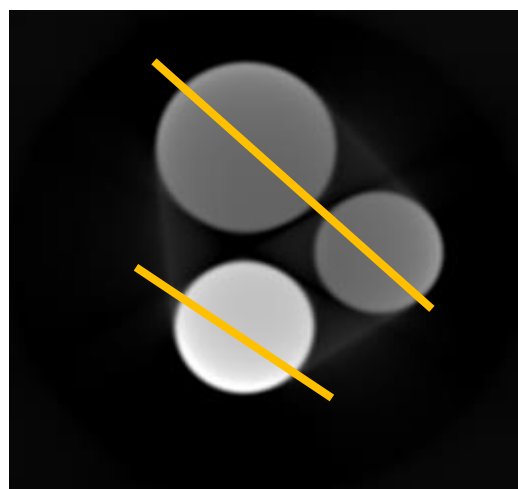
60 keV

Polychromatic



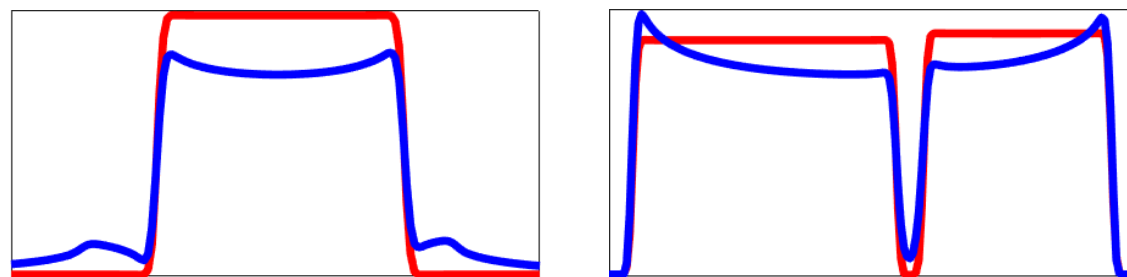


Filtered back projection  
of attenuation

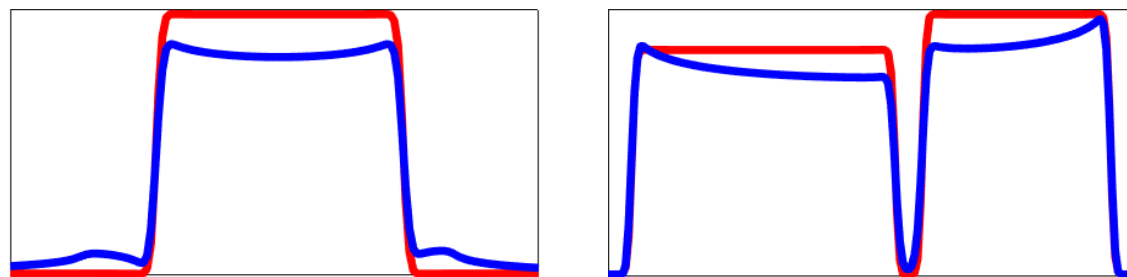


— Ground Truth — Simulation

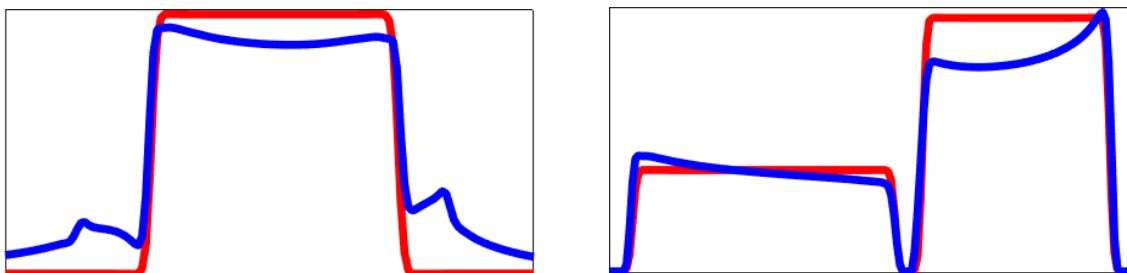
## Attenuation

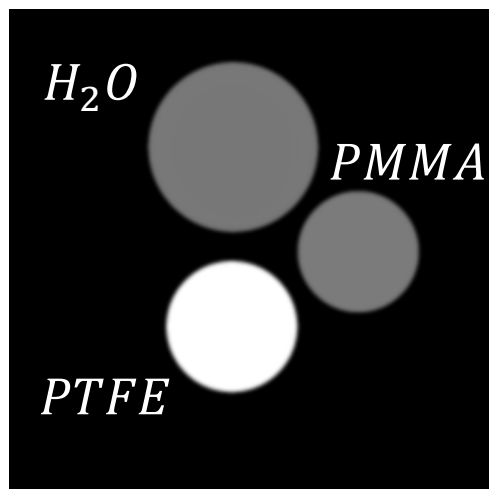


## Refractive Decrement

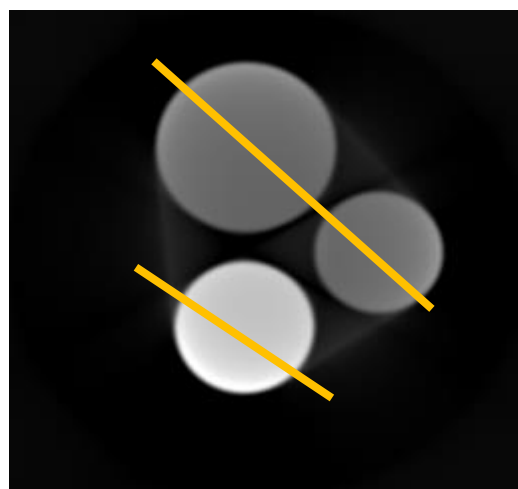


## Scatter



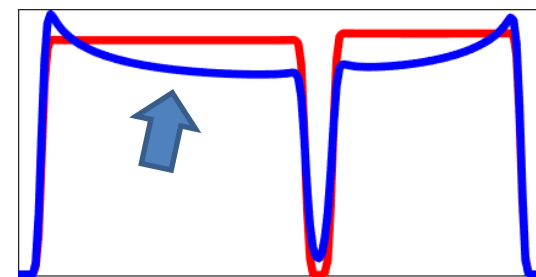
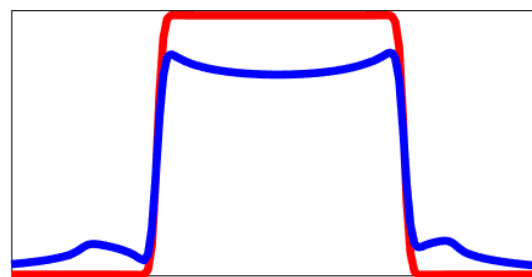


Filtered back projection  
of attenuation

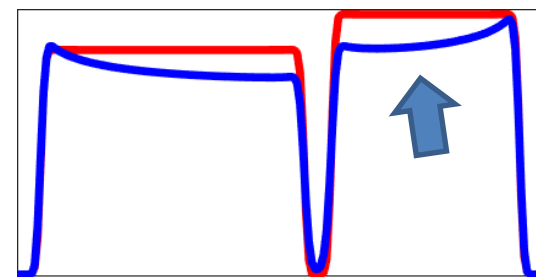
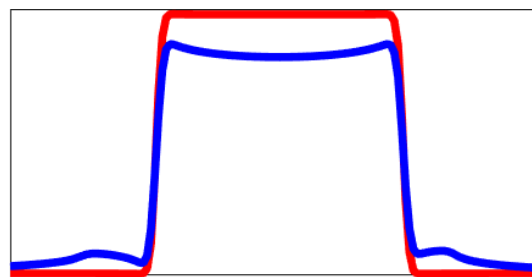


— Ground Truth — Simulation

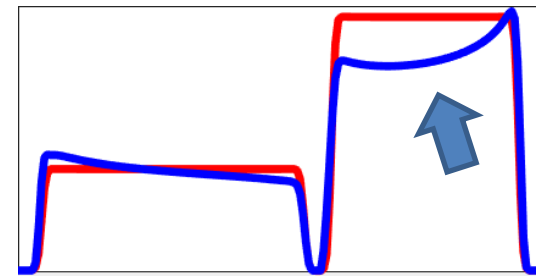
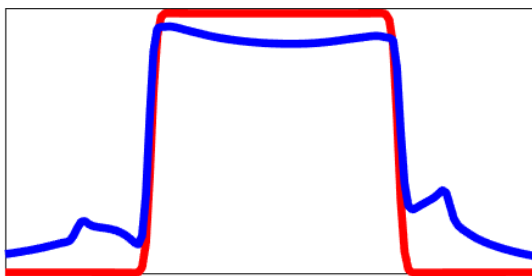
## Attenuation

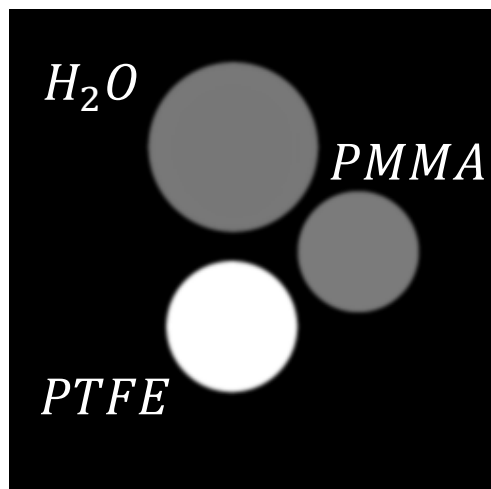


## Refractive Decrement

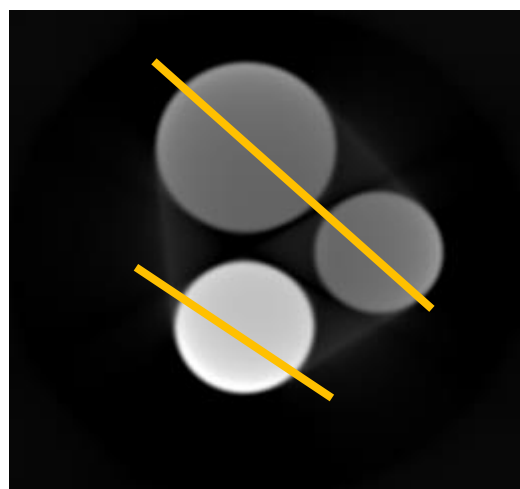


## Scatter



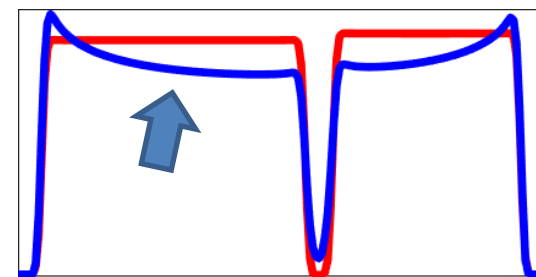
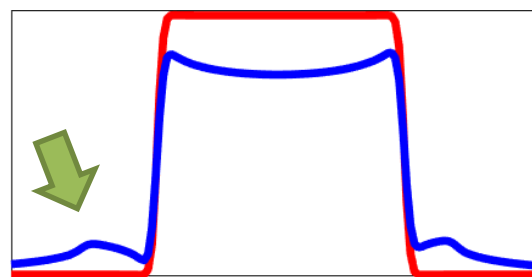


Filtered back projection  
of attenuation

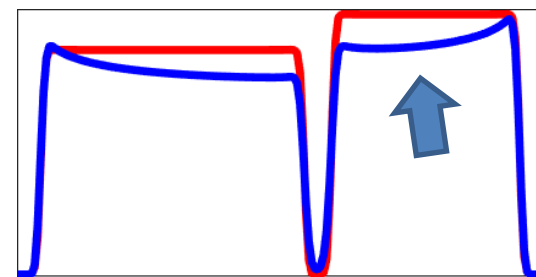
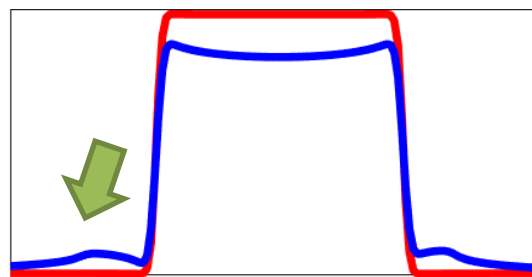


— Ground Truth — Simulation

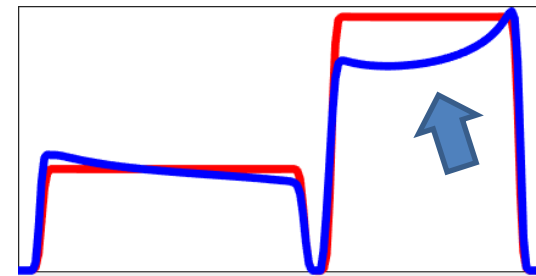
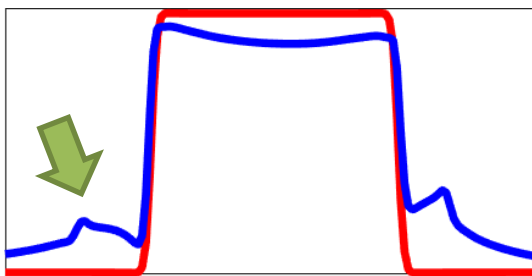
## Attenuation

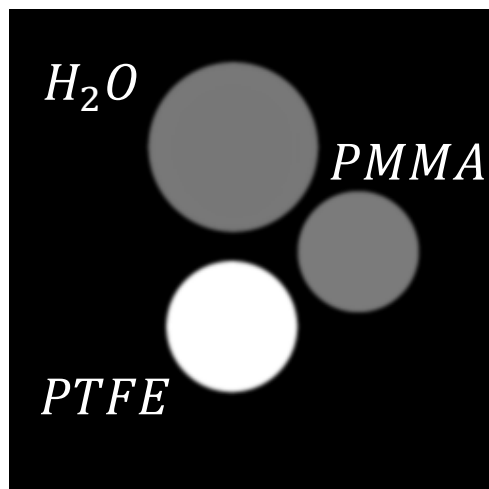


## Refractive Decrement

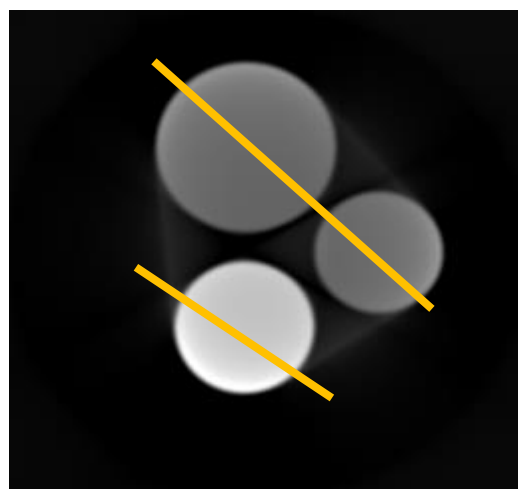


## Scatter



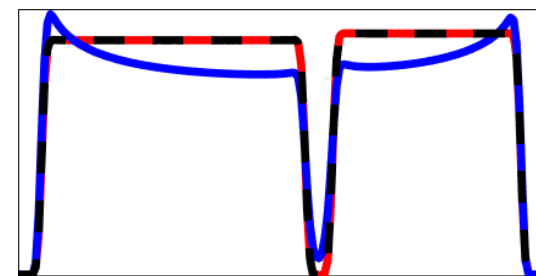
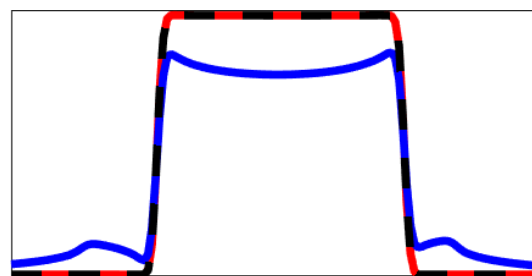


Filtered back projection  
of attenuation

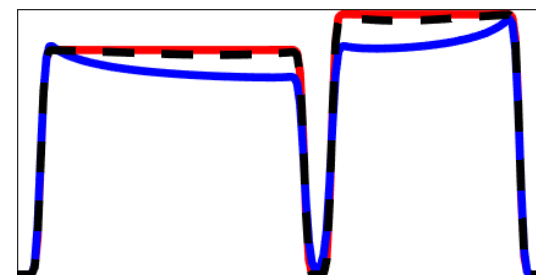
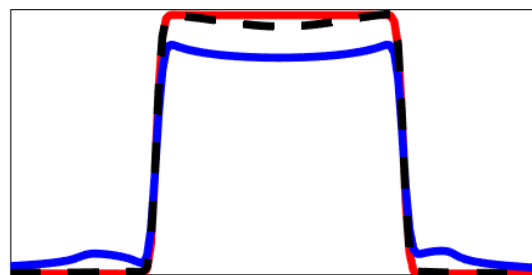


— Ground Truth — Simulation — Reconstruction

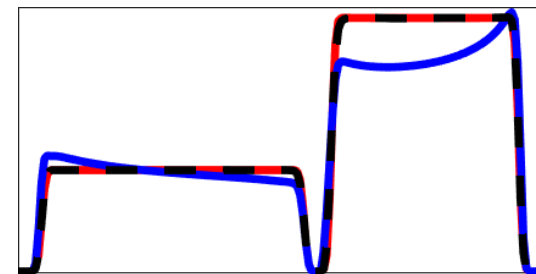
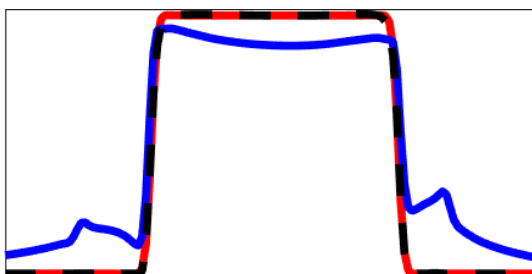
## Attenuation



## Refractive Decrement



## Scatter







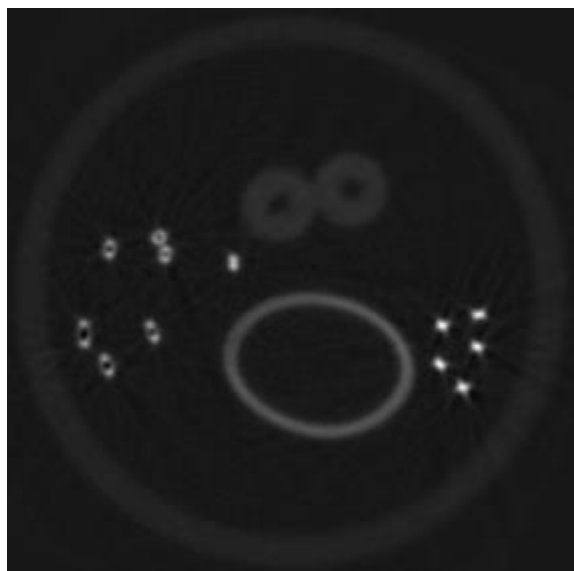
## Conclusion

- Polychromatic **artifacts** in grating-based X-ray imaging
- **Polychromatic** forward model
- Iterative reconstruction **removes** artifacts

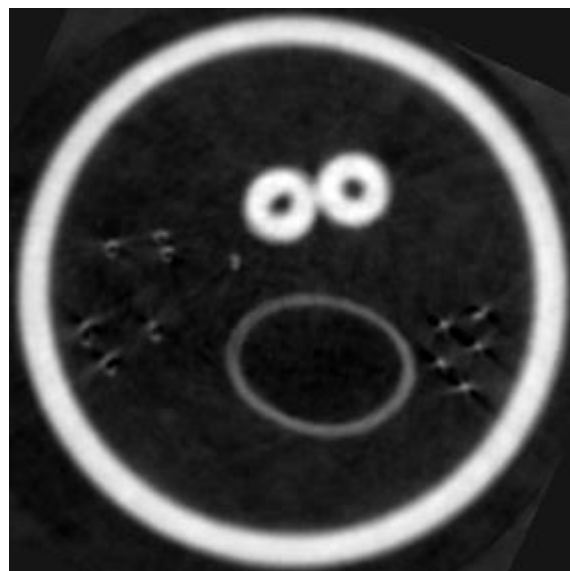
## Future work

- Evaluation on **real data**
- **Efficient** implementation of algorithm

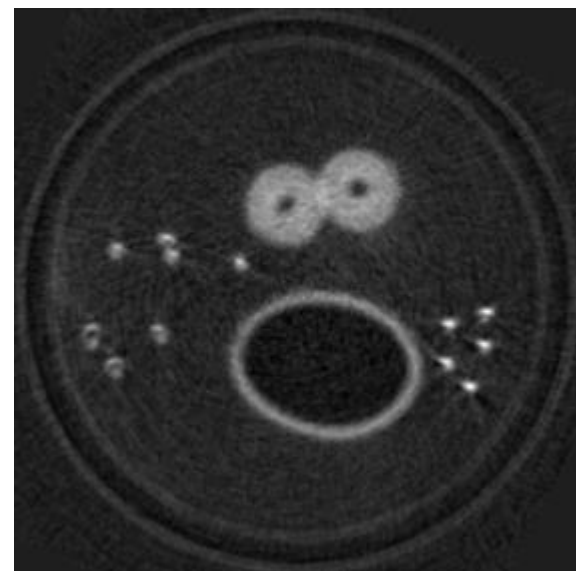
# Thank you



Attenuation



Phase



Scatter