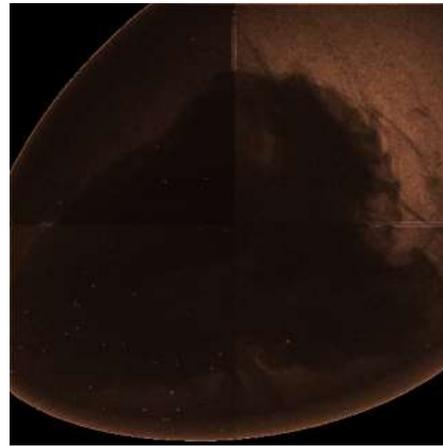
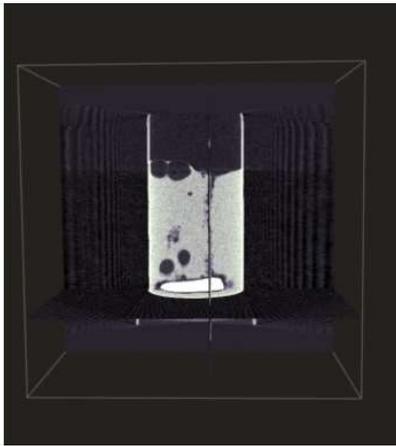
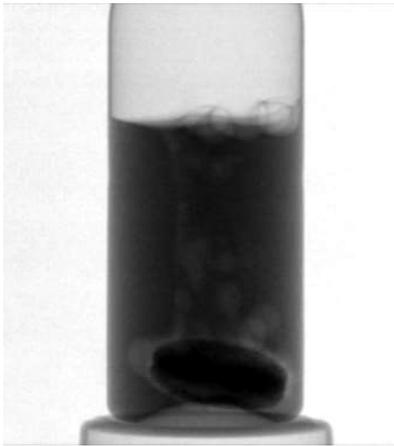
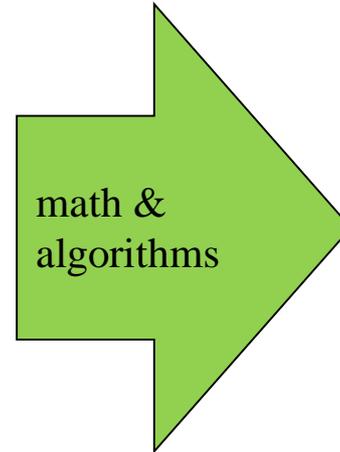
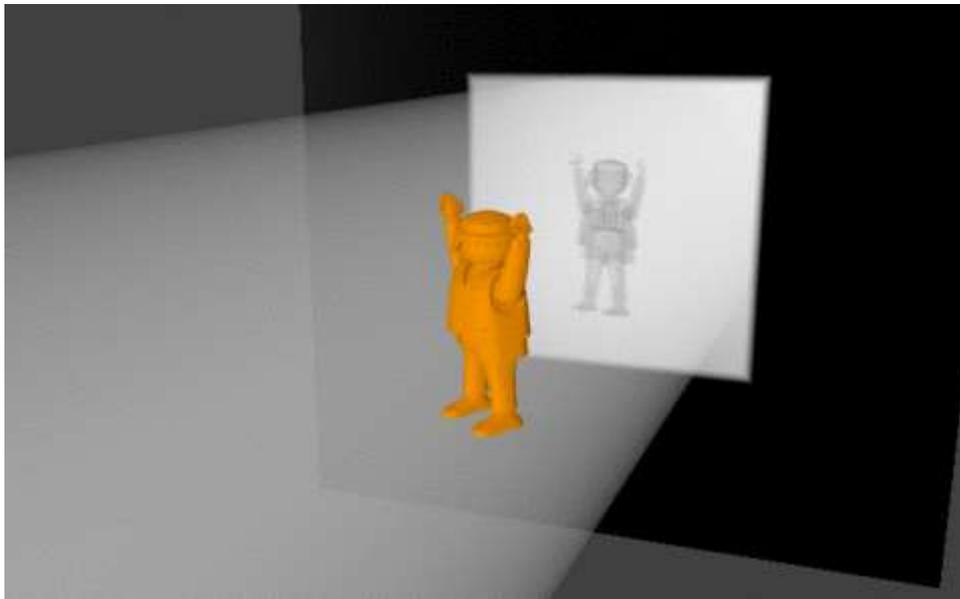


# The FleX-ray Lab: Past, Present and Future

Tristan van Leeuwen, Felix Lucka & Martin Fransen



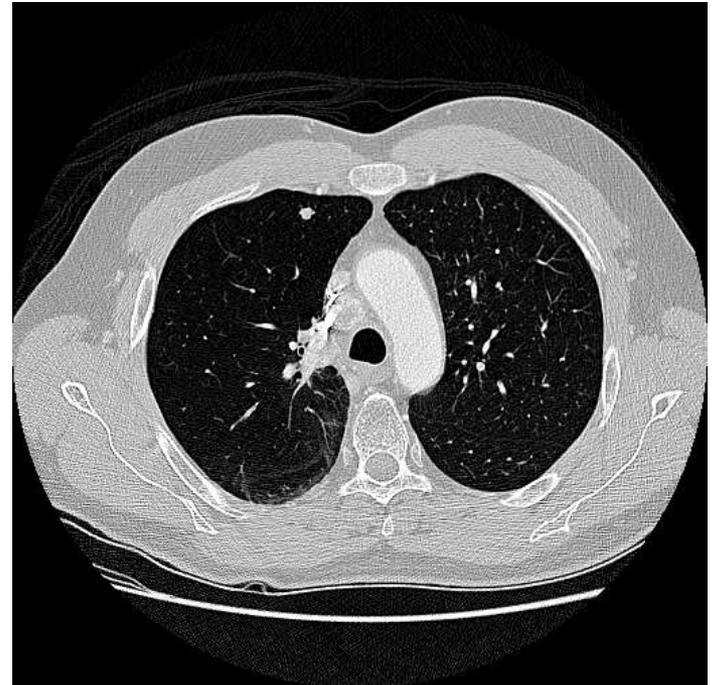
# X-ray Computed Tomography (CT)



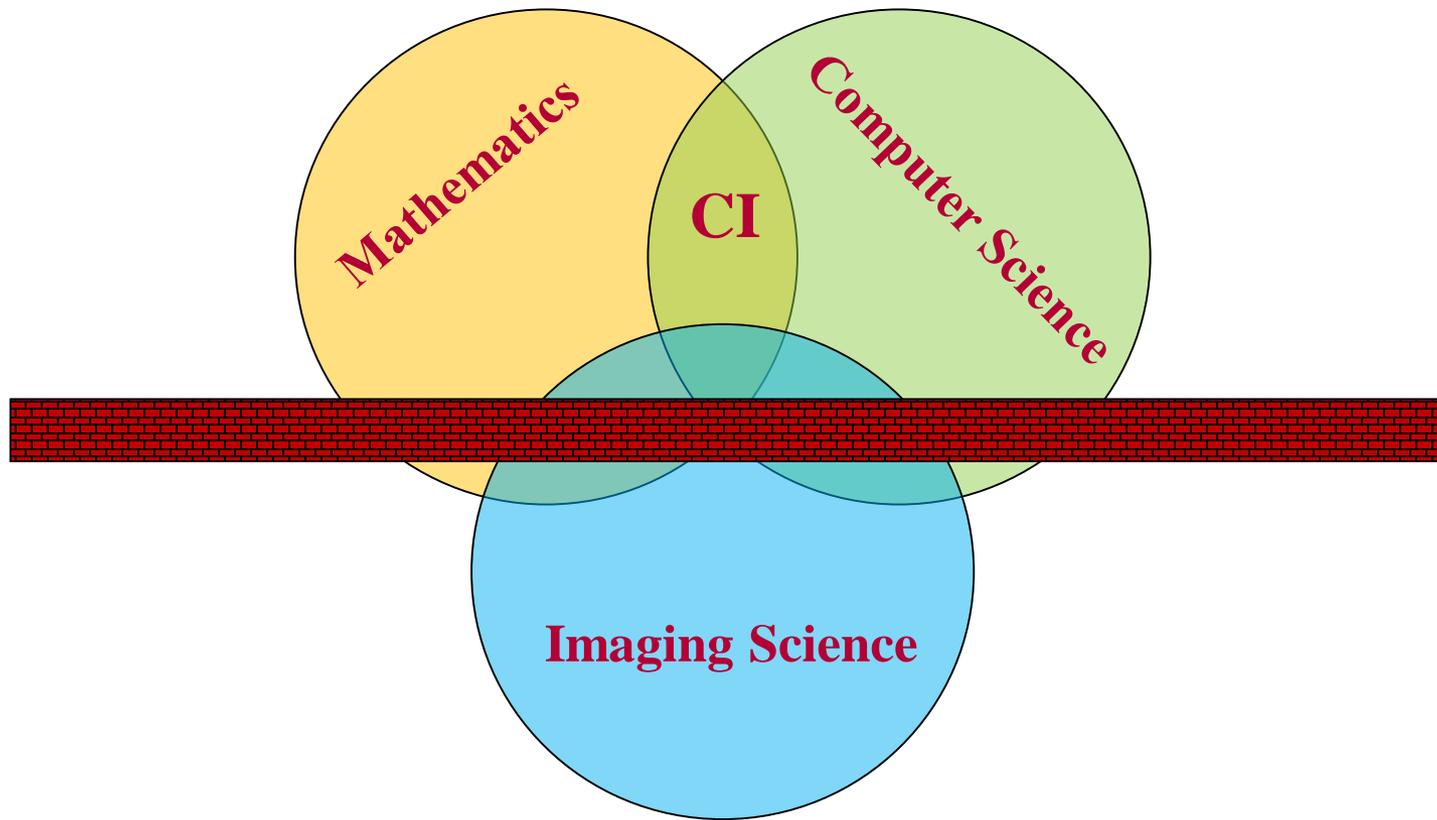
# Medical X-ray CT



math &  
algorithms



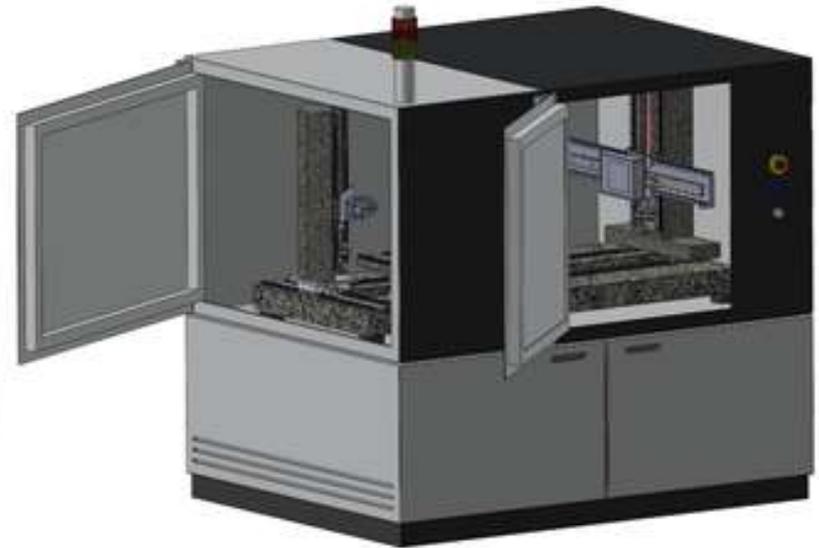
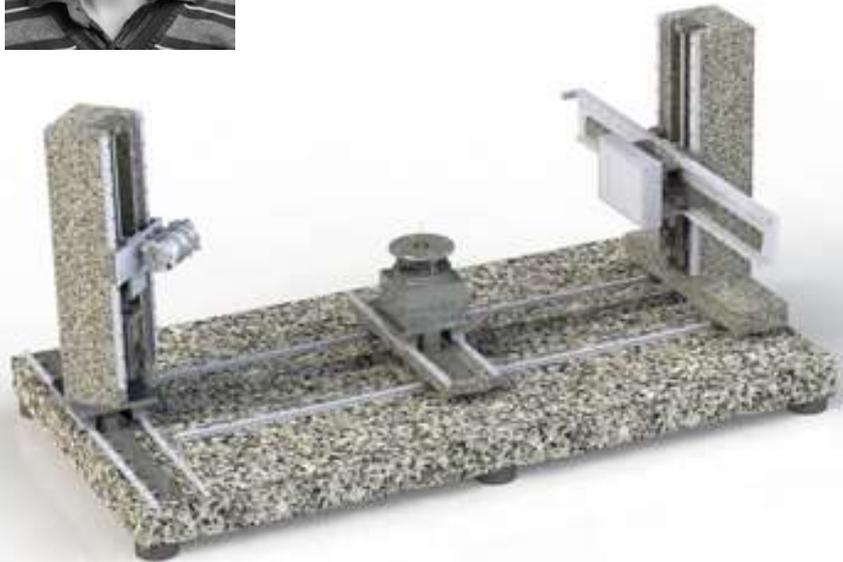
# Computational Imaging



CWI



# The beginning of Flex-ray



CWI



CWI

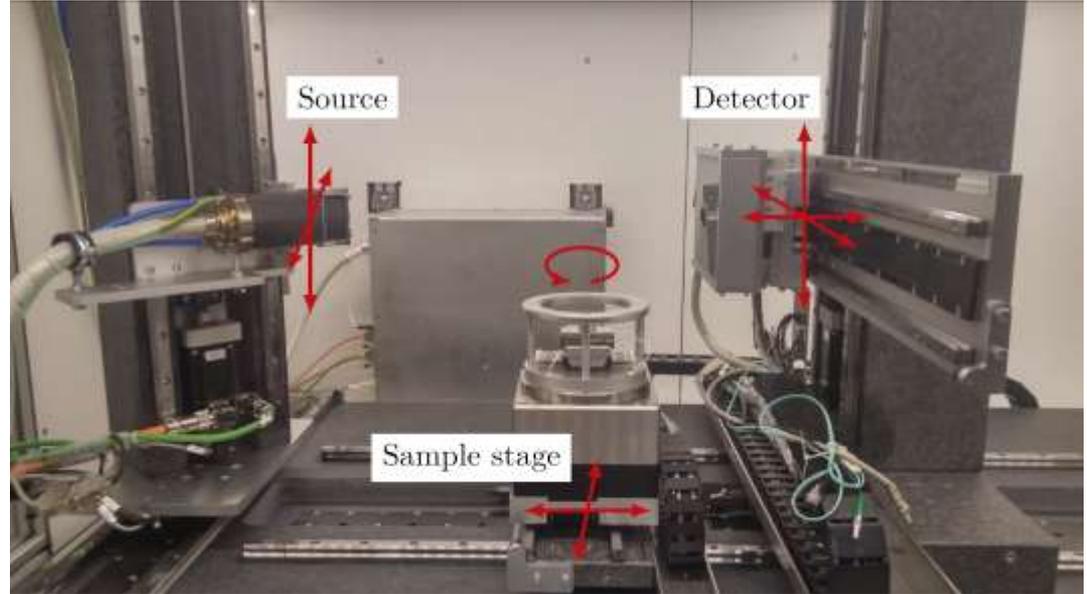
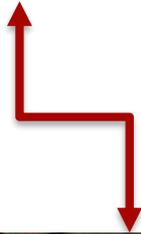


# The opening

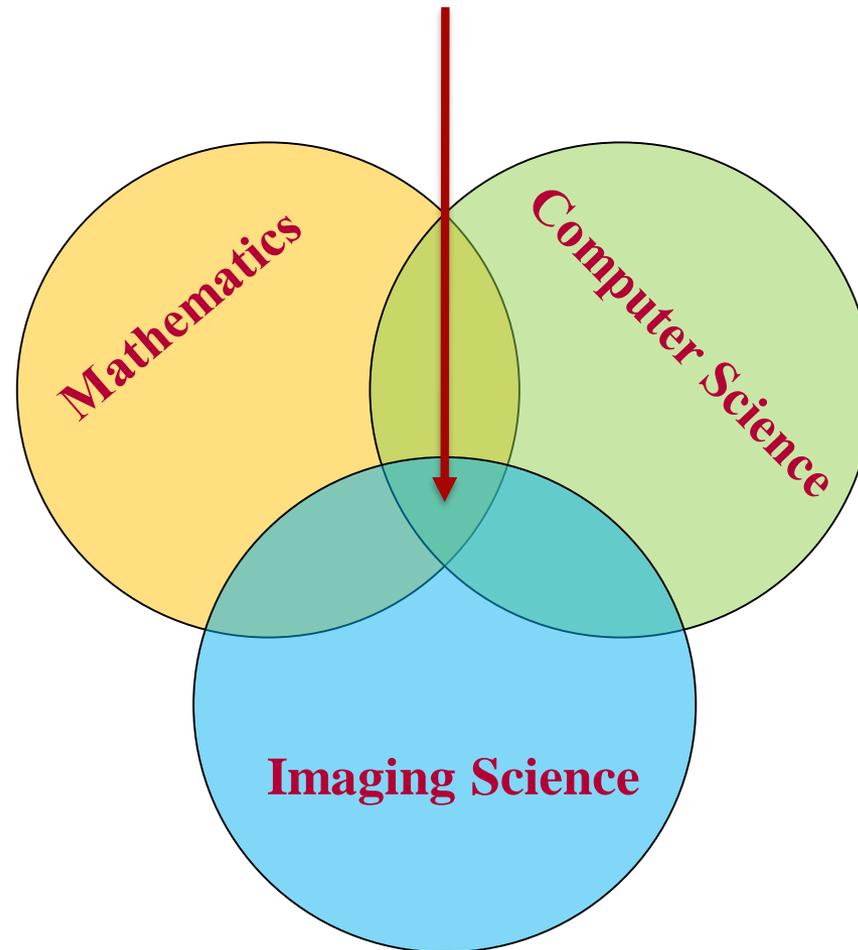


CWI

# The FleX-ray Lab



# The FleX-ray Lab



**CWI**

# **Selected Highlights**

CWI

# Cultural heritage & natural history



# CWI

Artifact

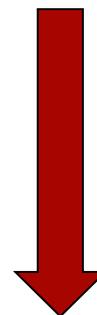
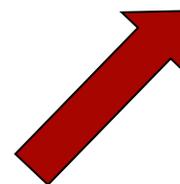
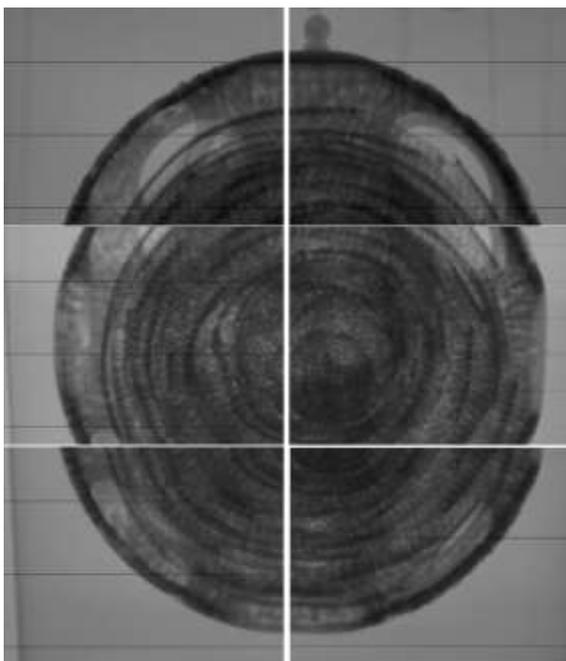
FlexRay scan

3D reconstruction

Image processing

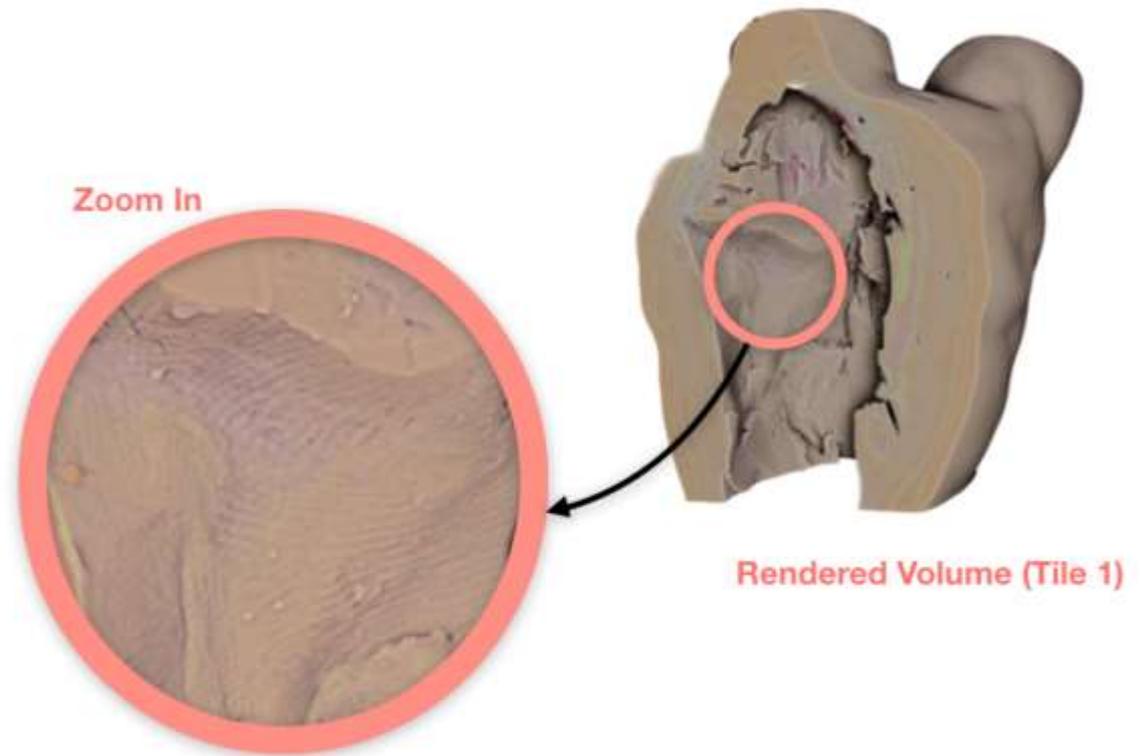
Patterns

Visualization

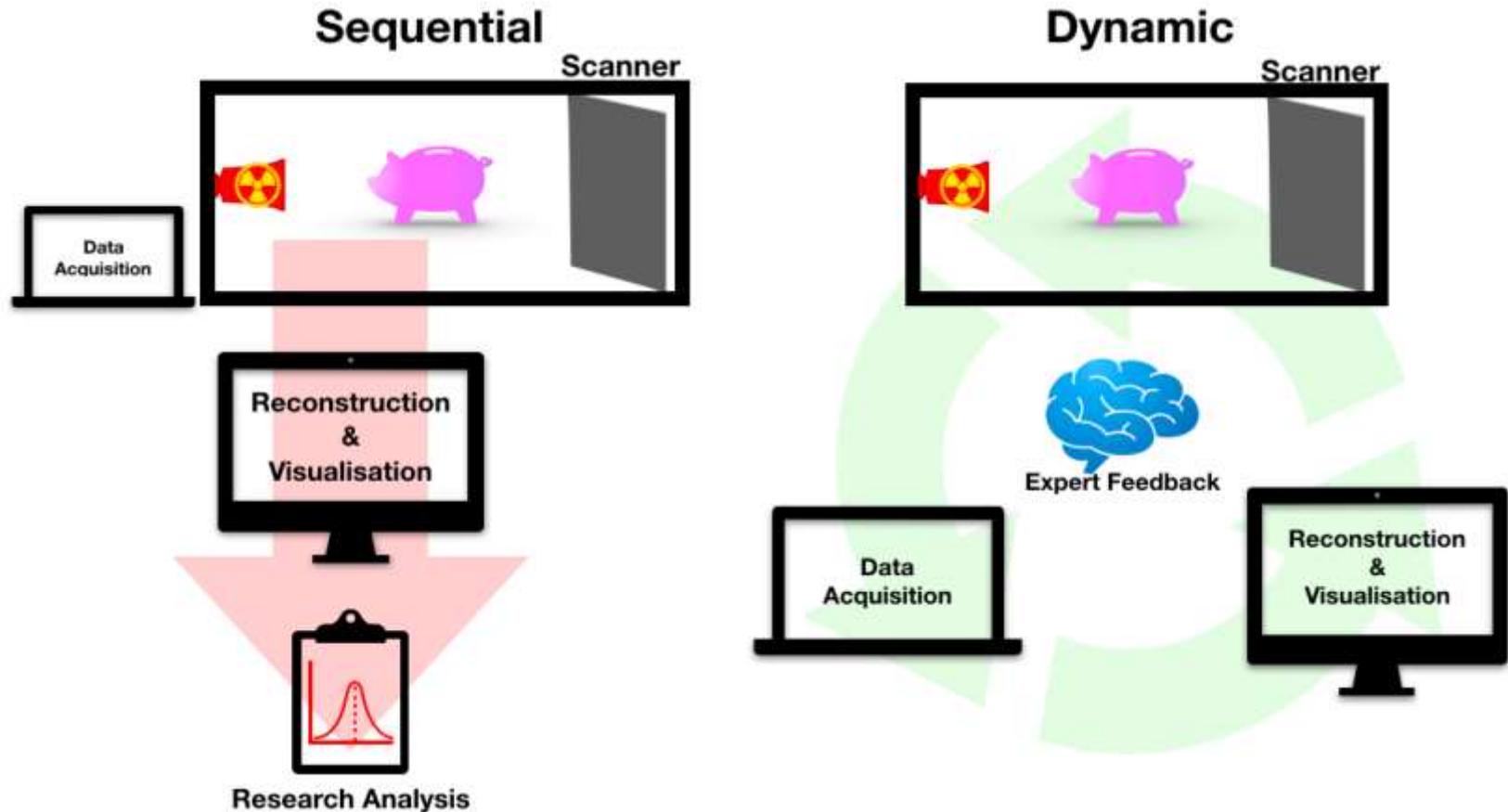




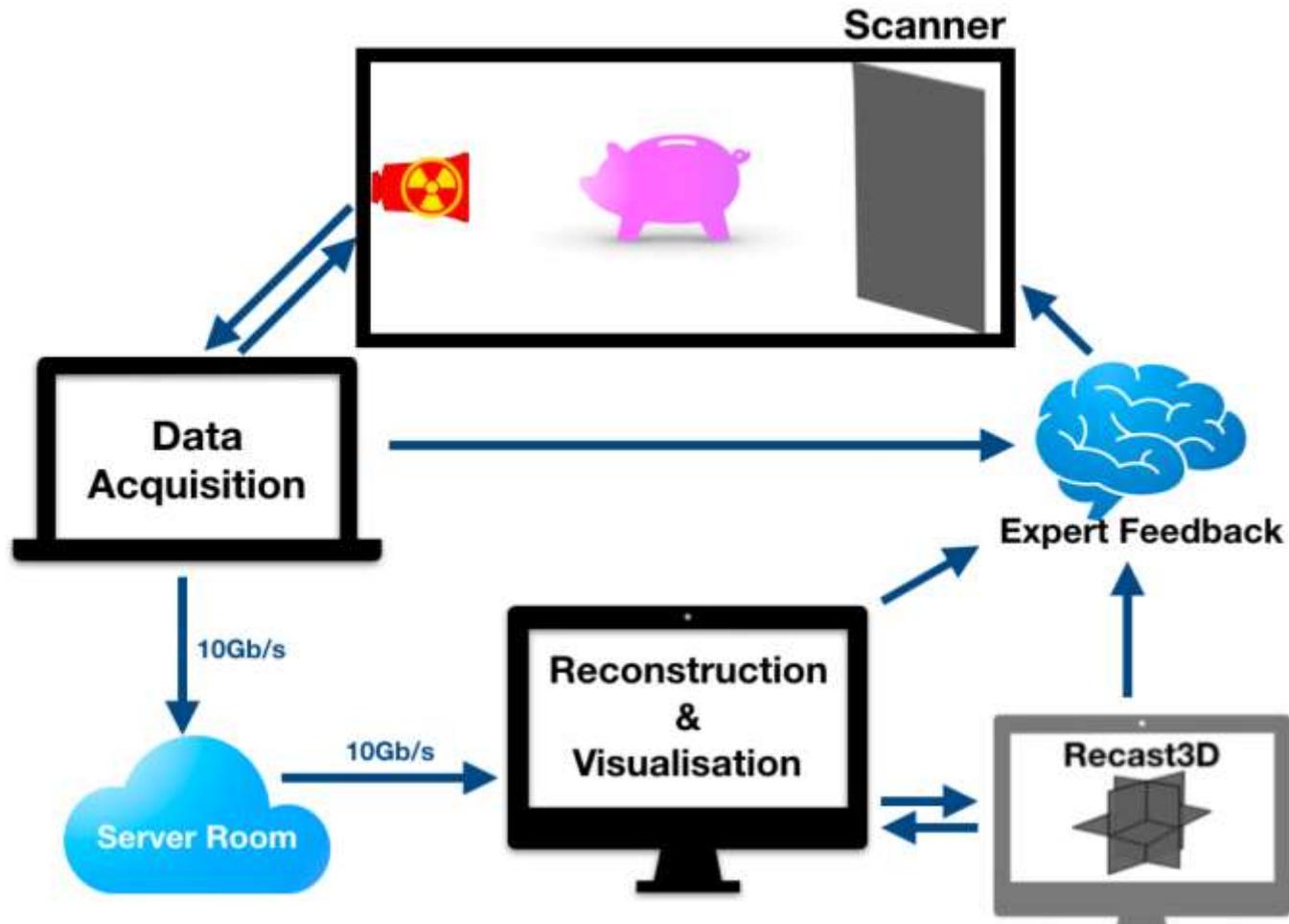
## Michelangelo...or not?



# Explorative imaging

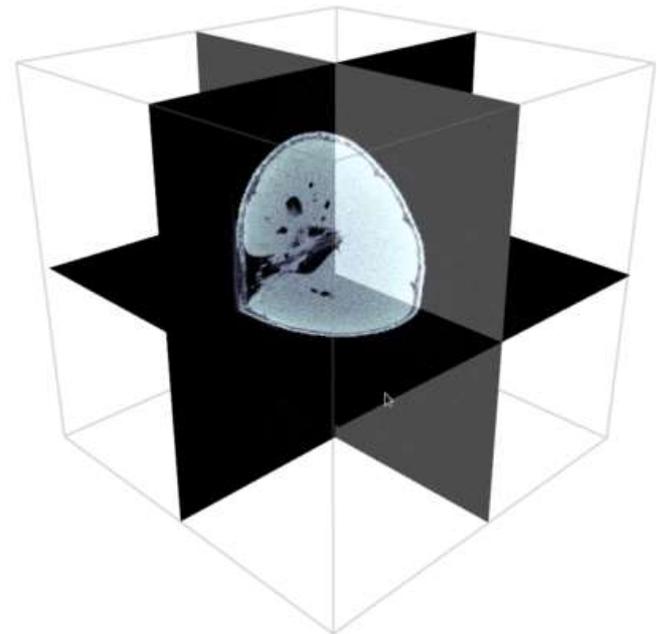
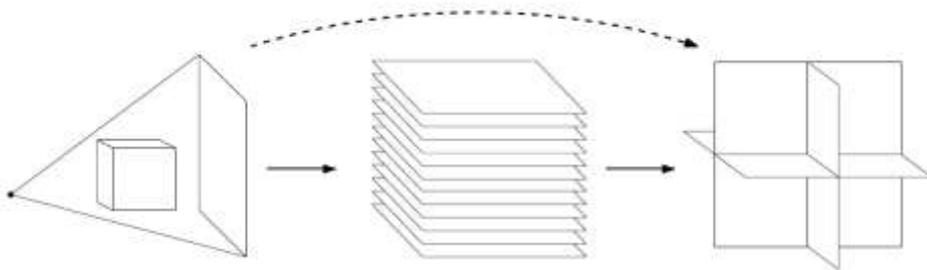


# Explorative imaging



# RECAST3D

- **Real-time quasi-3D reconstruction and visualization of arbitrary slices**
- **Plugin infrastructure for on-the-fly analysis**
- **Active experimental adaptation & control**



**CWI**

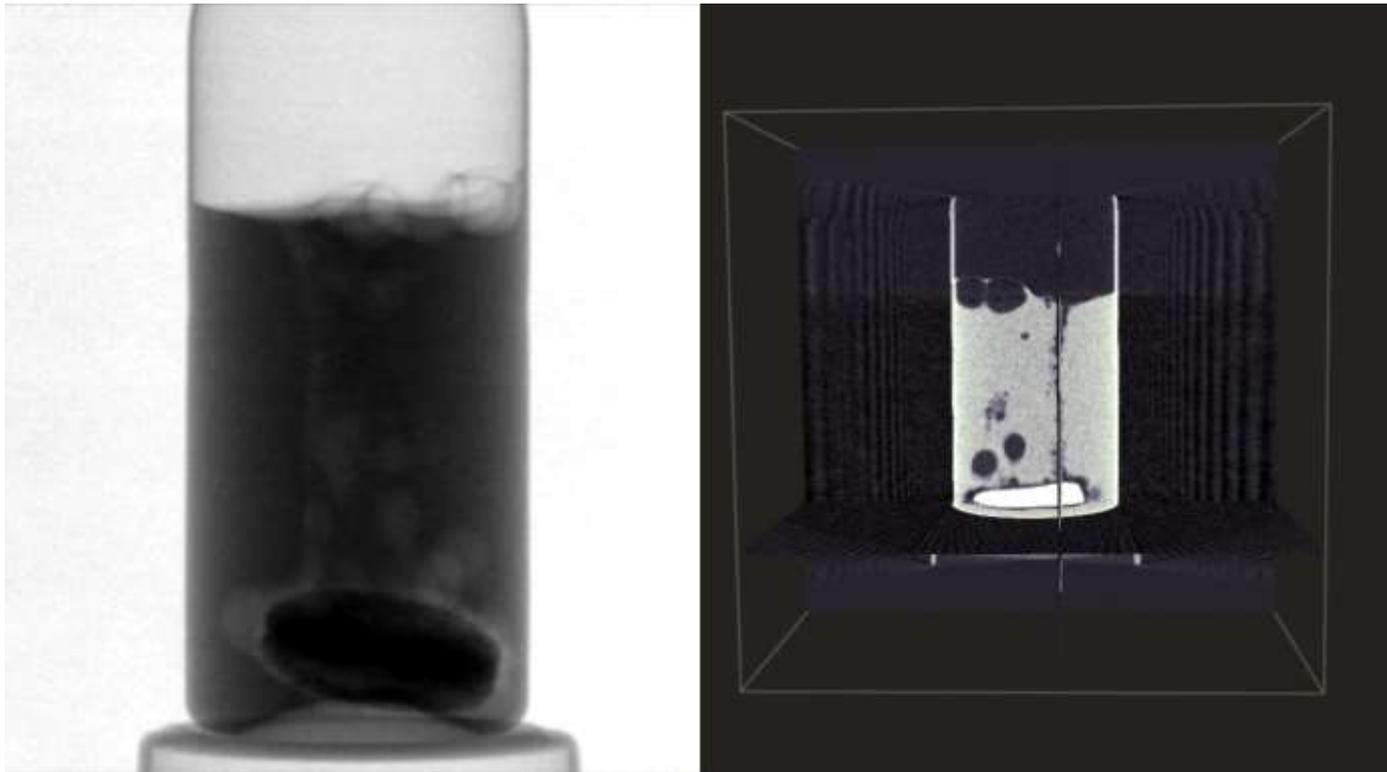
**Did someone say live demo?**

CWI

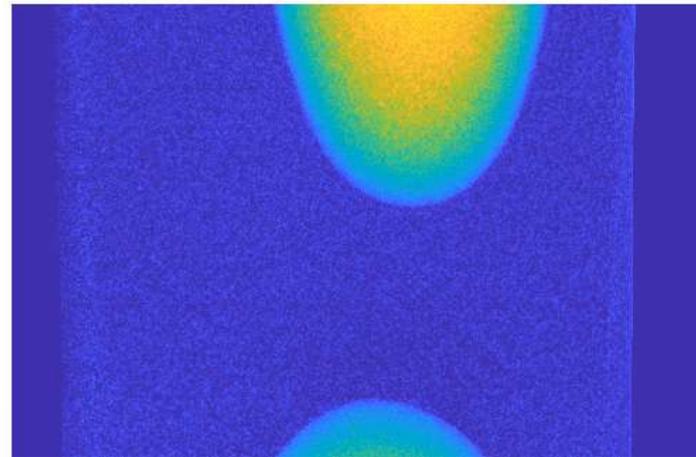
## Well...Murphy's law



# Dynamic real-time imaging and scan adaptation



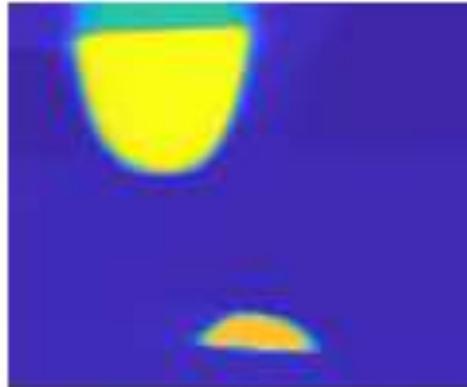
# Imaging dynamic processes



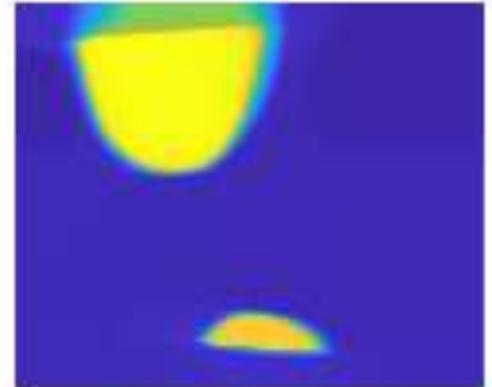
# Imaging dynamic processes



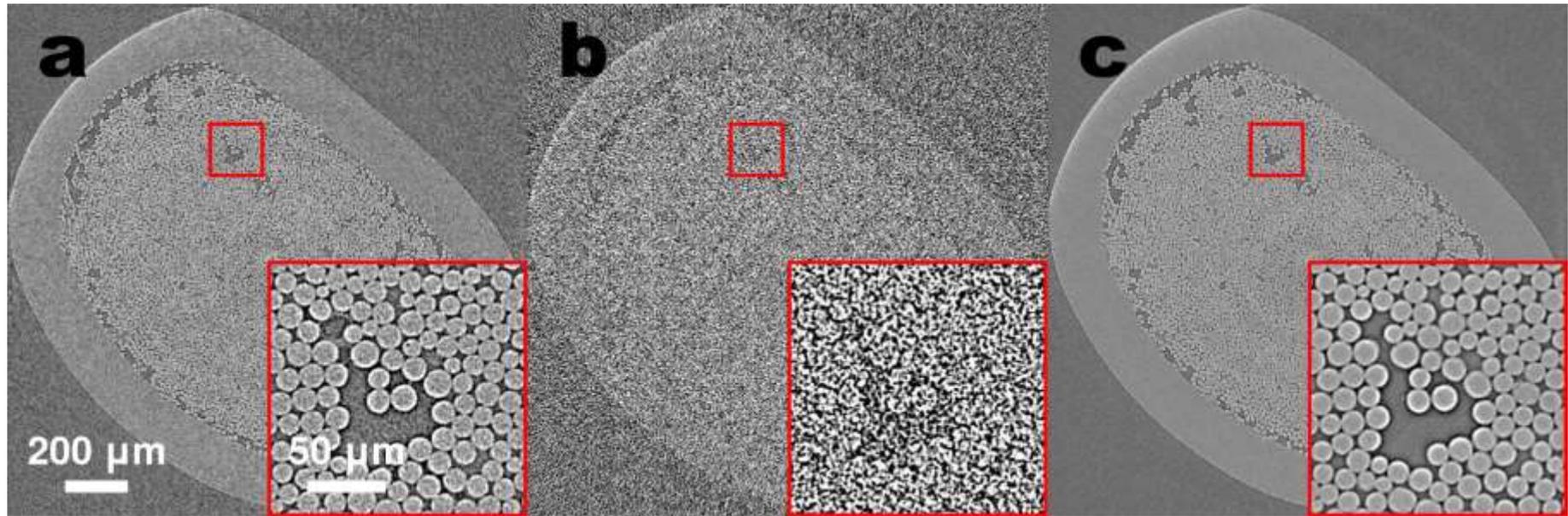
linear



non-linear



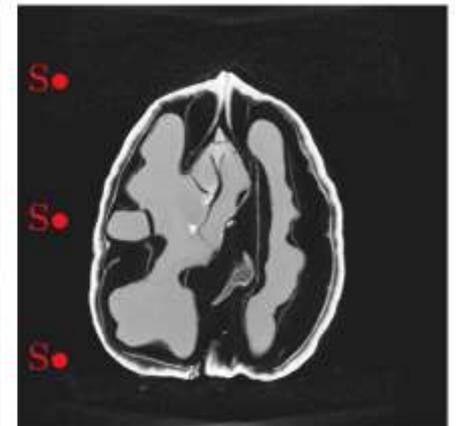
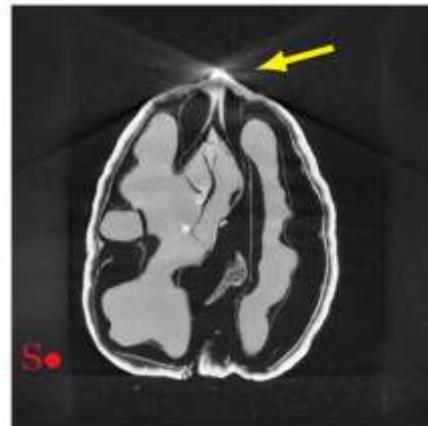
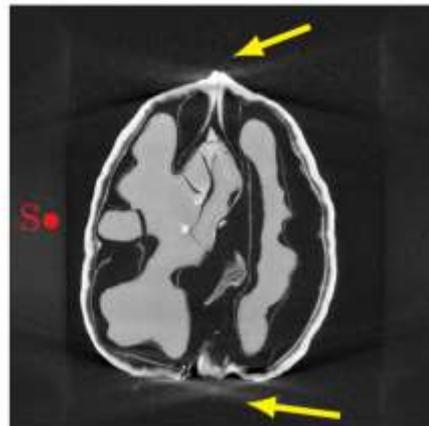
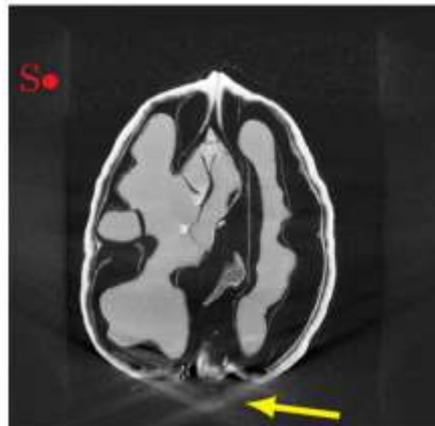
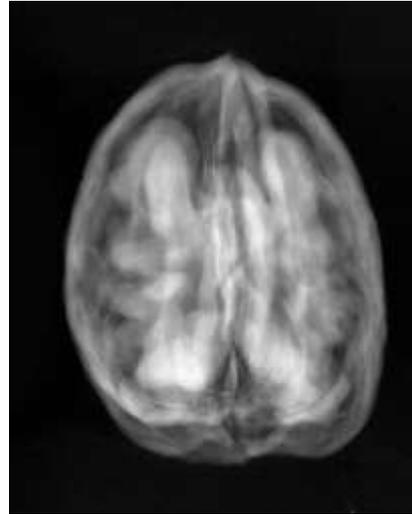
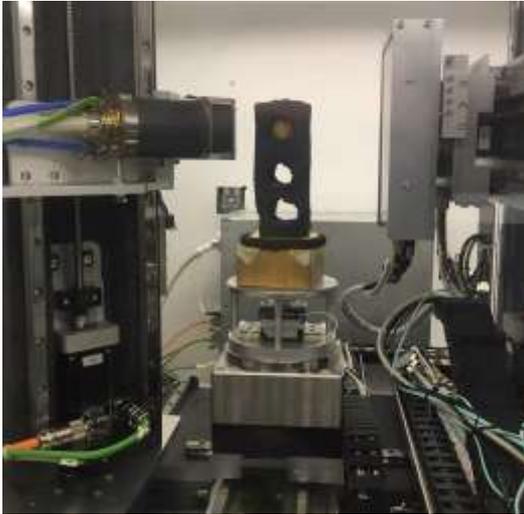
# AI in tomography



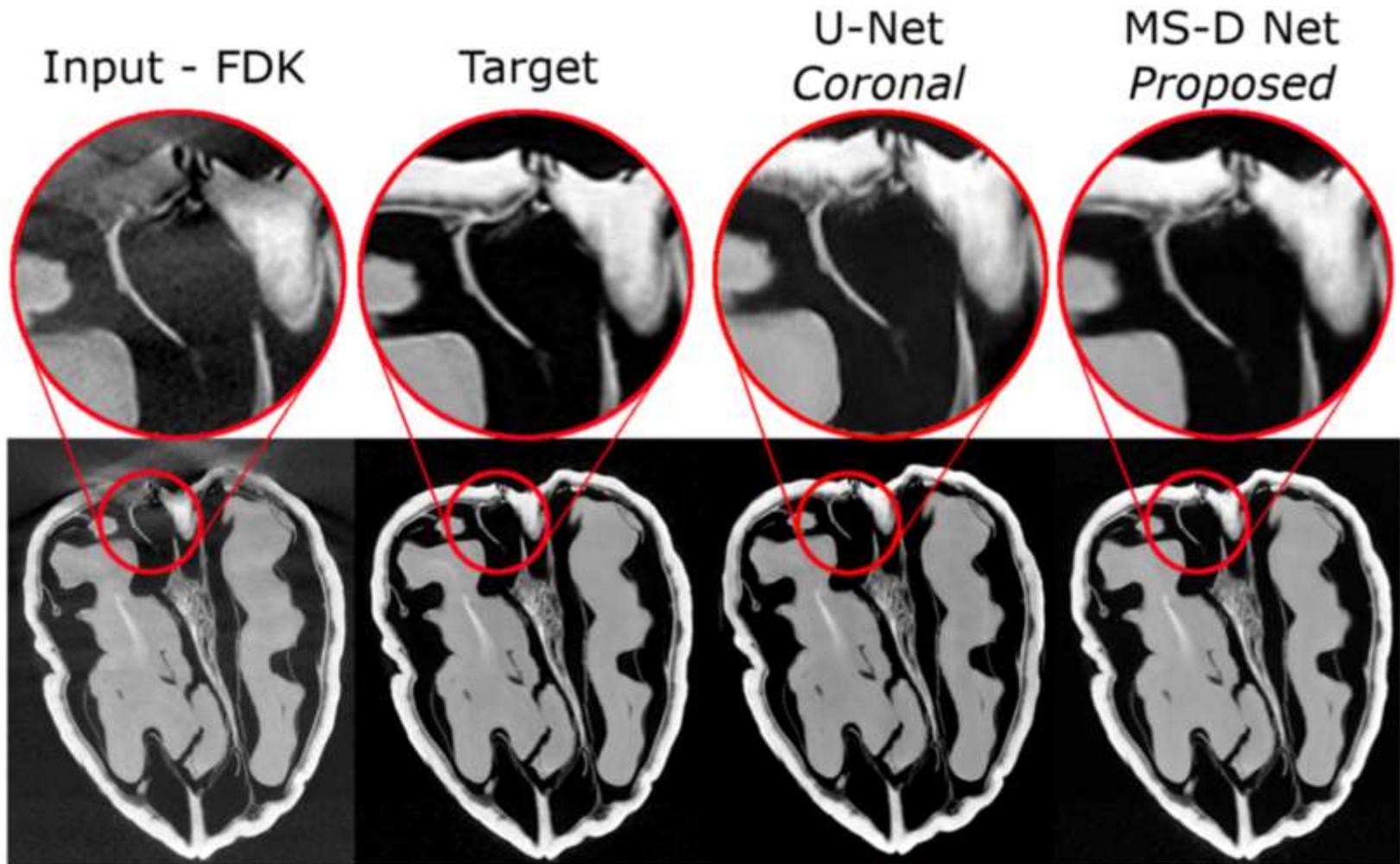
- **data collections**
- **scaling**
- **robustness**

- **task-adaptation**
- **software coupling**
- **real-time**

# Open data collections for machine learning



# Open data collections for machine learning



# Open data



## Computational Imaging -- Centrum Wiskunde & Informatica

### Recent uploads

**March 14, 2022 (v1)** Dataset Open Access View

**Trajectory with Overlapping Projections x-ray Computed Tomography (TOP-CT) dataset of 23 mandarins moving over a circular trajectory**

 Dirk Elias Schut

Summary This dataset is a collection of X-ray projection images of 23 mandarins moving over a circular trajectory in such a way that the projections of multiple adjacent mandarins overlap. The dataset was acquired to test out Trajectory with Overlapping Projections x-ray Computed Tomography (TOP-CT).

Uploaded on March 24, 2022.

**January 17, 2022 (v1)** Dataset Open Access View

**A collection of 131 CT datasets of pieces of modeling clay containing stones - Part 5 of 5**

 Mathè T. Zeegers

Summary This submission contains a collection of 131 CT scans of pieces of modeling clay (Play-Doh) with various numbers of stones inserted. The submission is intended as raw supplementary material to reproduce the CT reconstructions and subsequent results in the paper titled 'A tomographic wo

Uploaded on January 19, 2022.

**January 17, 2022 (v1)** Dataset Open Access View

**A collection of 131 CT datasets of pieces of modeling clay containing stones - Part 4 of 5**

 Mathè T. Zeegers

Community



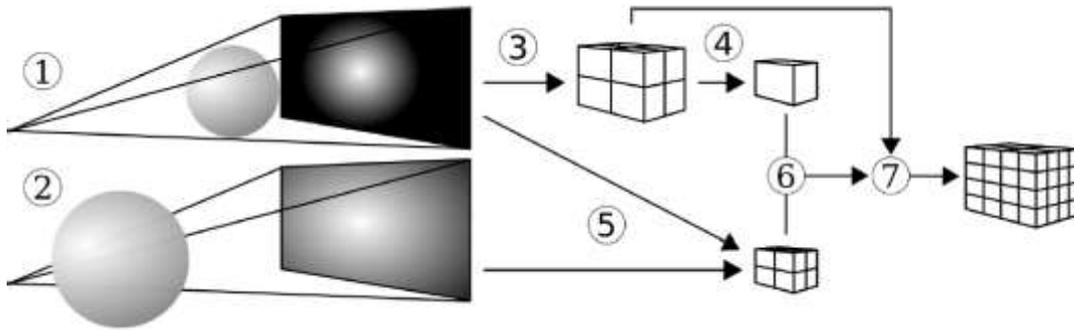
**Computational Imaging -- Centrum Wiskunde & Informatica**

Welcome to the Zenodo community for the Computational Imaging at Centrum Wiskunde & Informatica (CI-CWI).

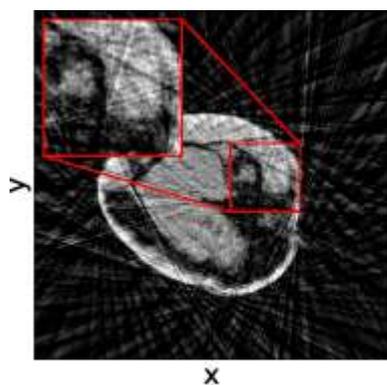
This community, created and maintained by the CI-CWI, is a collection of the research materials produced by its members.

Here, you can find various dataset collected by our flexible, state-of-the-art scanner, various publications, PhD or MSc Thesis supplements and conference presentations by the CI-CWI members.

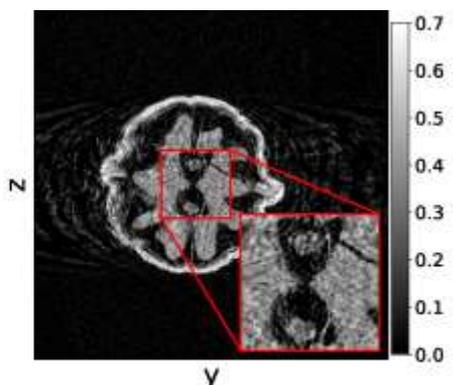
## On-the-fly Machine Learning for superresolution



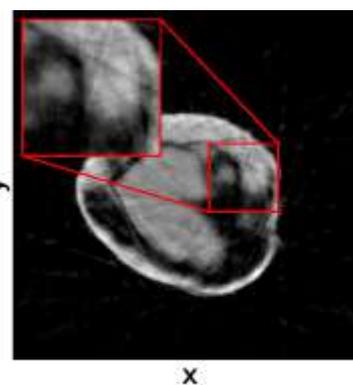
# Efficient ML-based large-scale 3D tomography



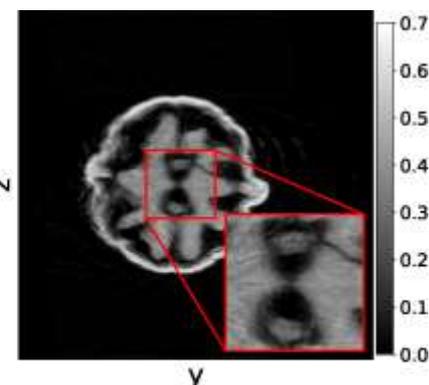
(a)



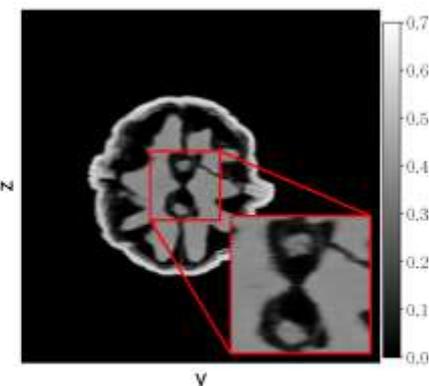
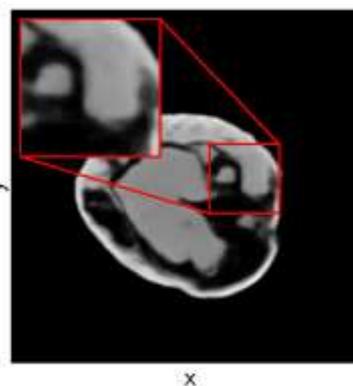
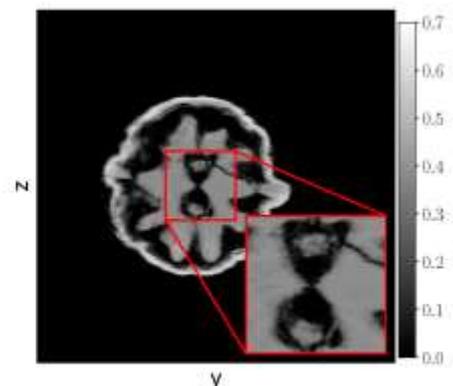
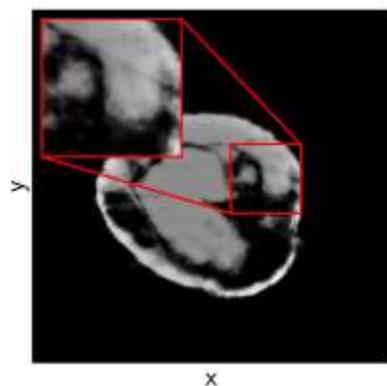
(b)



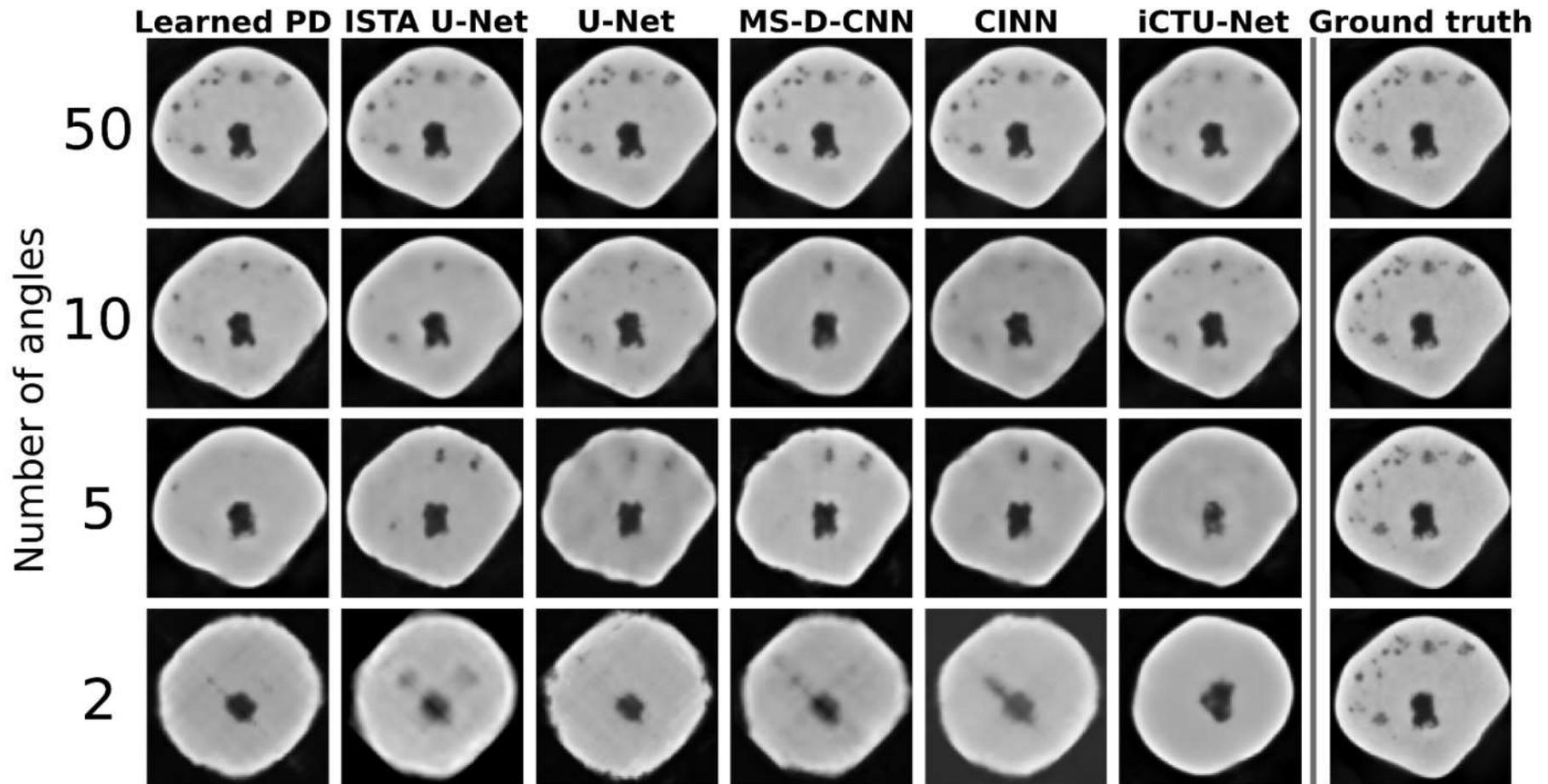
(c)



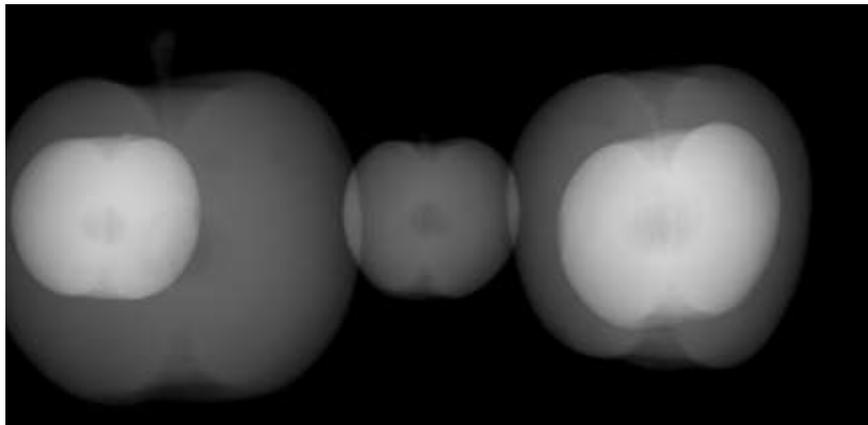
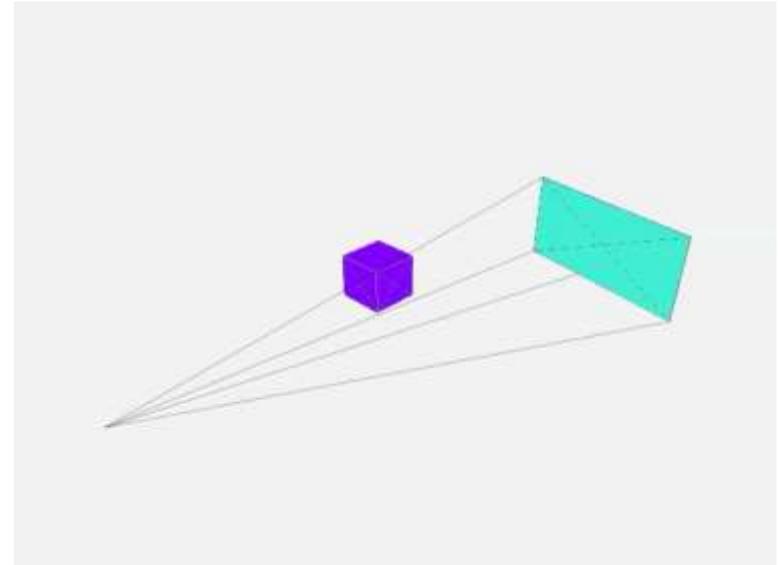
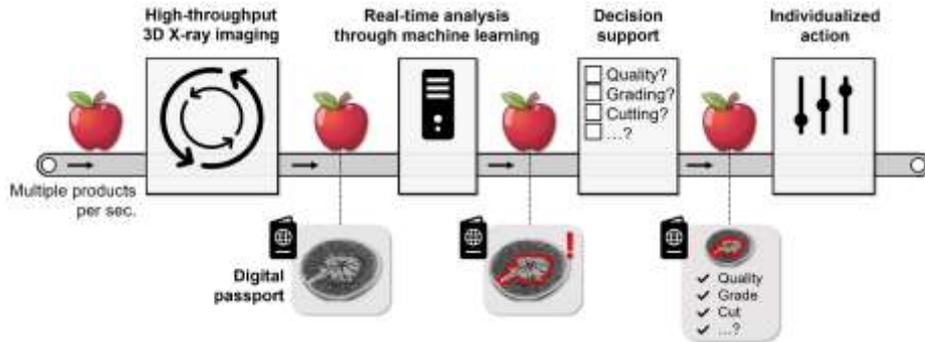
(d)



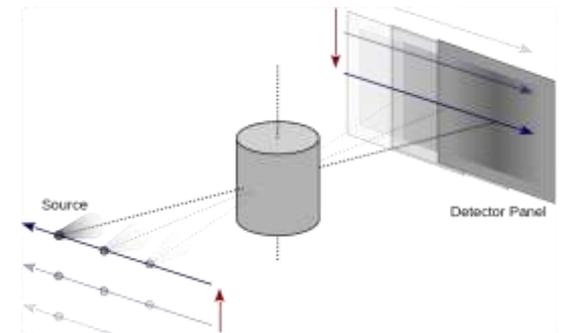
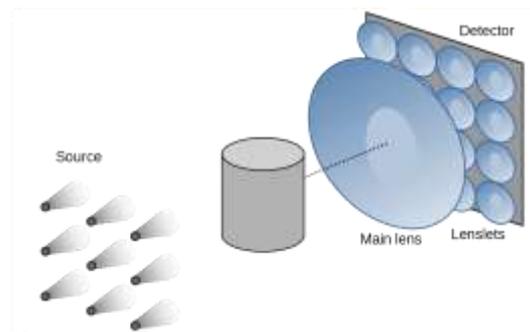
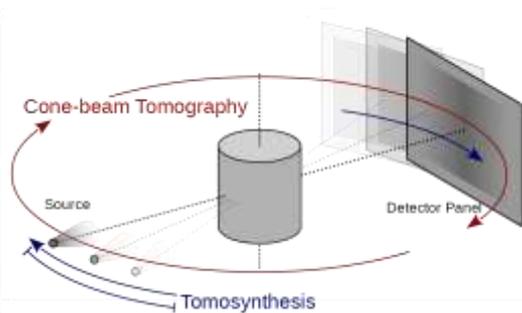
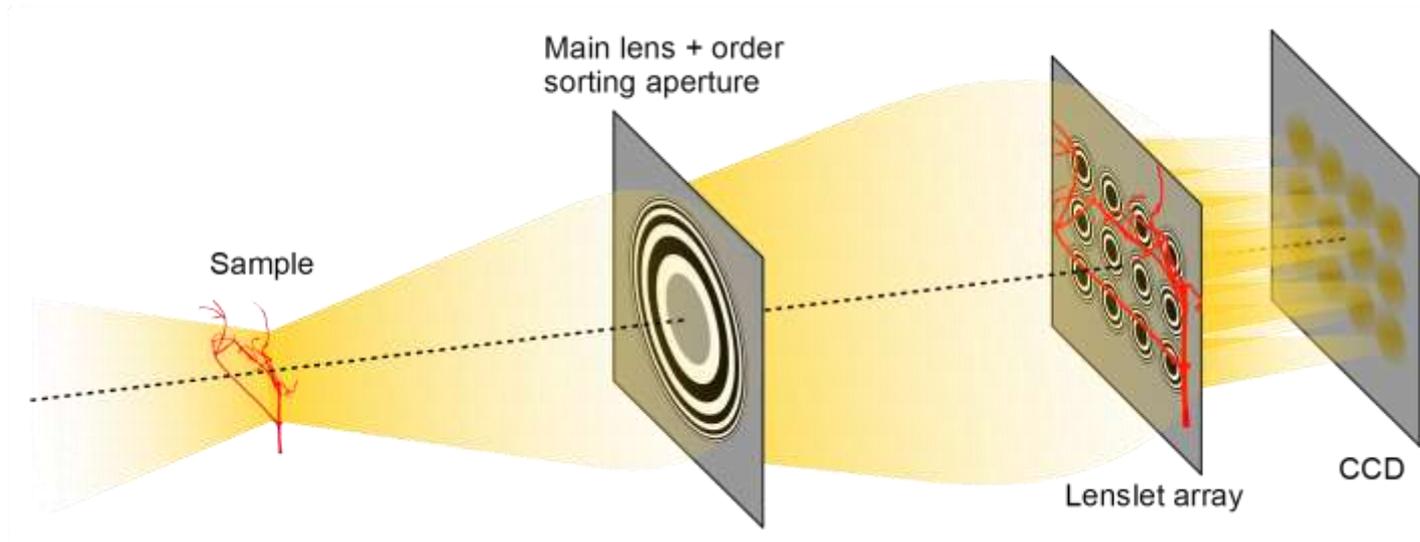
# Benchmarking AI



# Imaging for the Industry 4.0



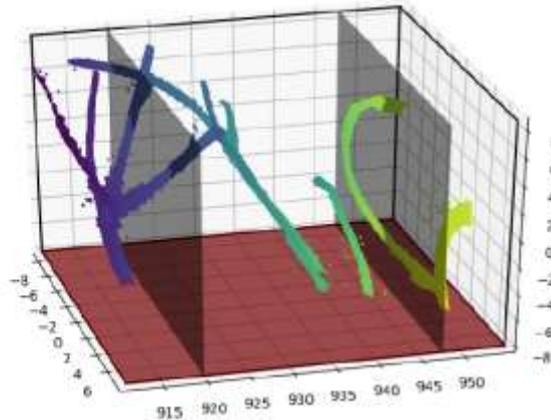
# Emulation of X-ray light-field cameras



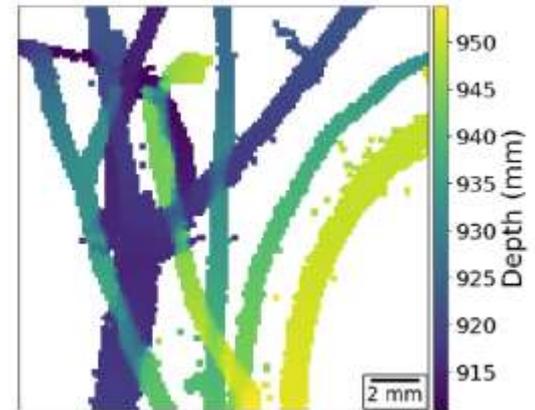
# Emulation of X-ray light-field cameras



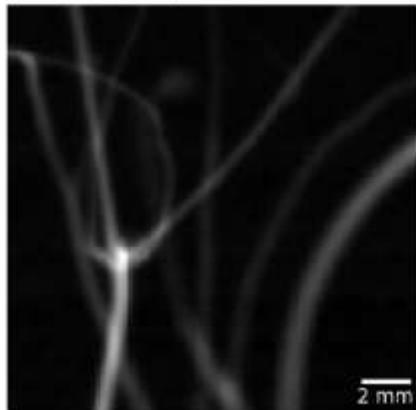
(a) Sample



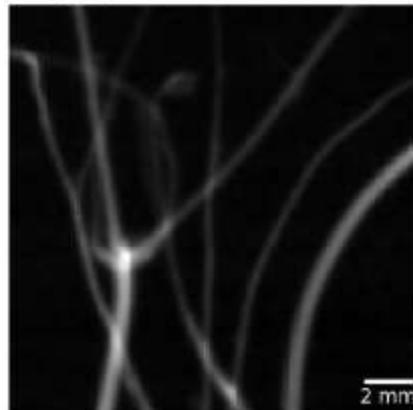
(b) Tomographic reconstruction



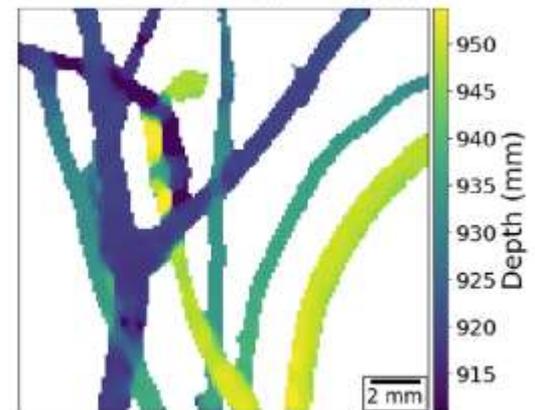
(c) Depth map tomography



(d)  $z = 917.527$  mm



(e)  $z = 947.496$  mm



(f) Depth map light-field

# Looking at colours the eye can't see

Spectral X-ray imaging with Medipix3 in FleX-ray

Martin Fransen

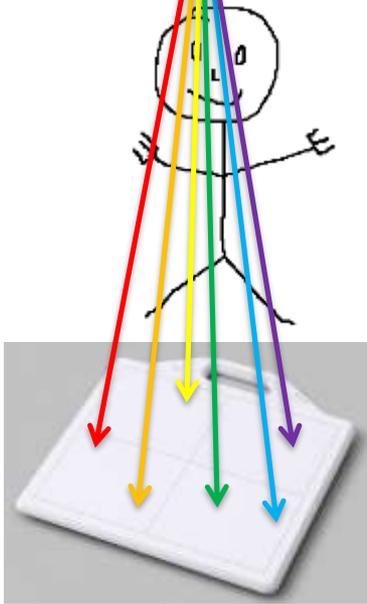
Nikhef



# Conventional X-ray image



X-ray source  
(broad spectrum)



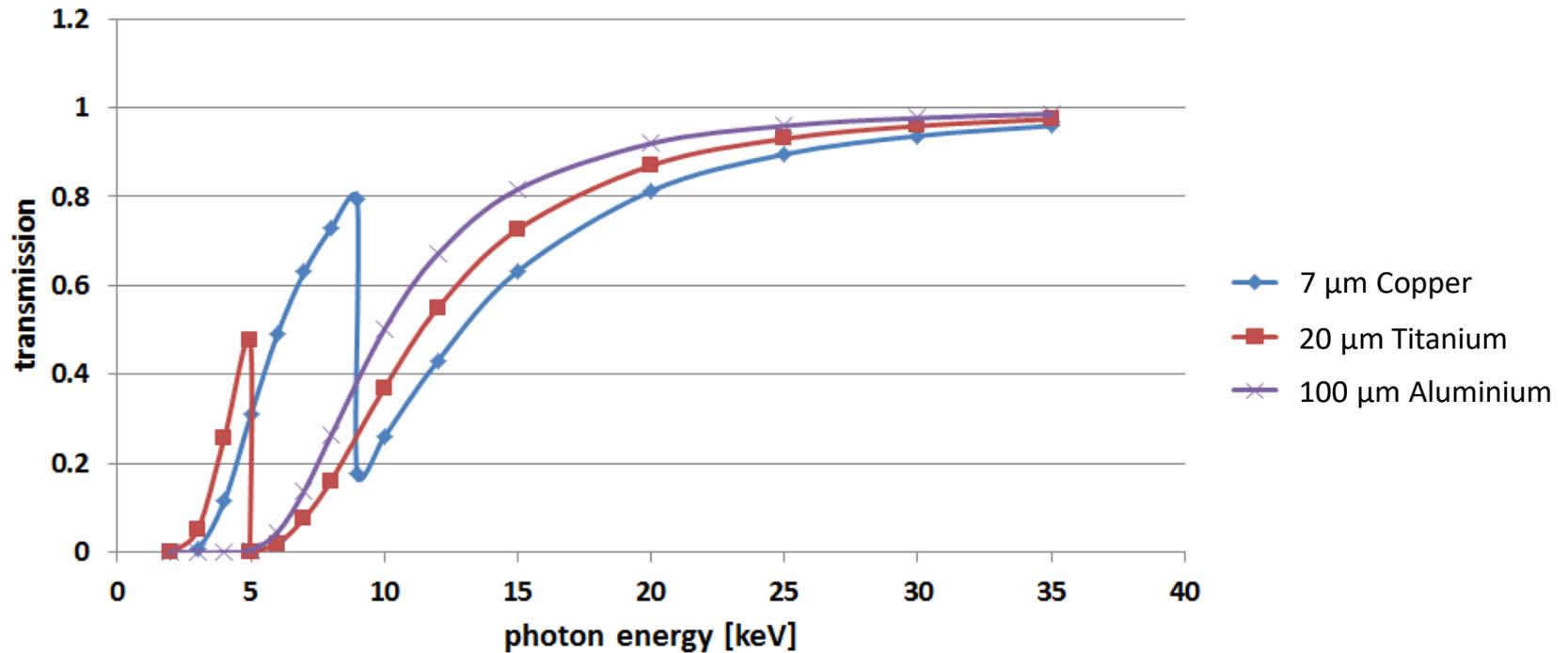
X-ray detector



grey scale image

# X-ray transmission

Unique for each element!

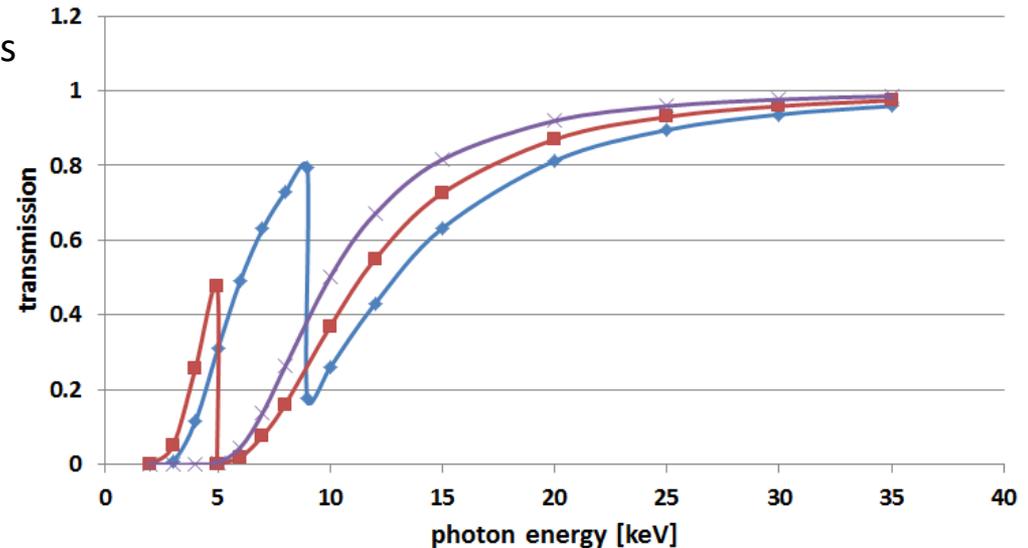


# X-ray transmission

- Easy to identify materials, right?
- Not with conventional X-ray imaging, pixels record total amount of X-ray energy!  
→ about the same shade of grey.

Also:

- Spectrum changes as X-rays traverse sample → beam hardening.
- Response to thickness and density variation is sensitive to thickness and density itself!



# X-ray detection

- Easy to identify materials, right?
- Not with conventional X-ray imaging, pixels record total amount of X-ray energy!  
→ about the same shade of grey.

Also:

- Spectrum changes as X-rays traverse sample → beam hardening.
- Response to thickness and density variation is sensitive to thickness and density itself!

Possible detector improvements:

- **Photon counting** (increasing 'weight' of low energy photons for better contrast)
- **Even better: Measure each photon's energy**

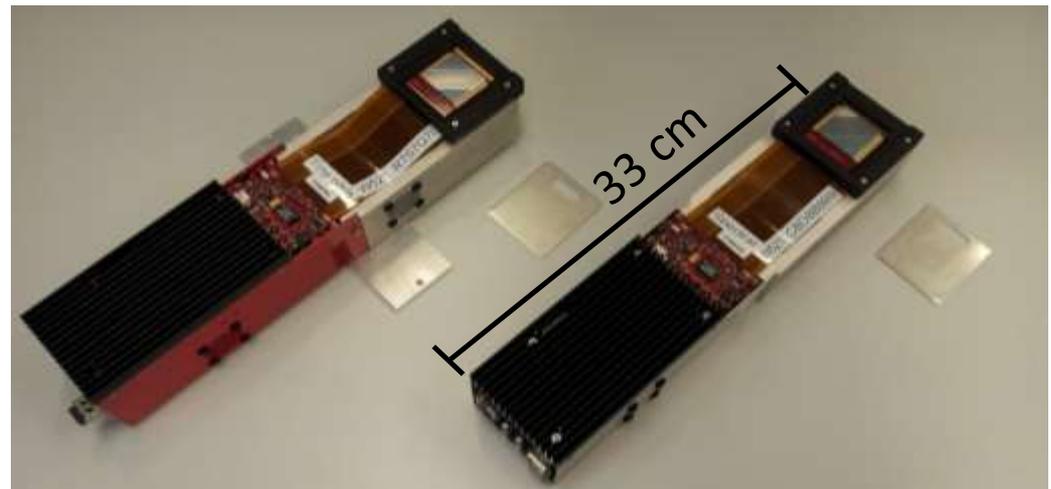
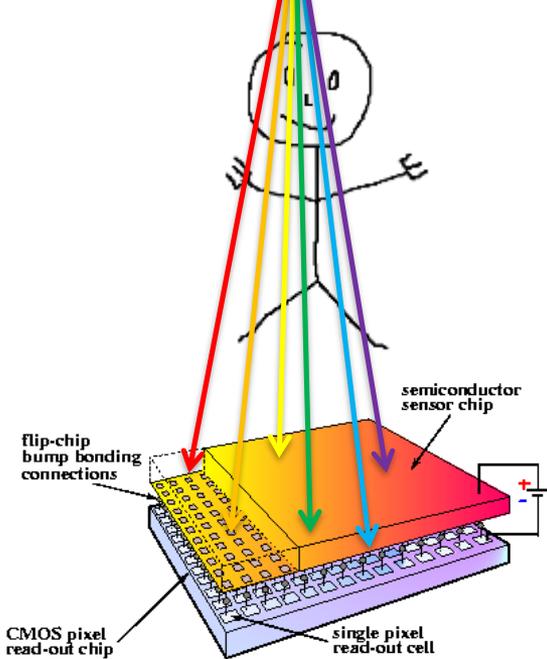
Common alternative: modifying X-ray spectrum by means of 'colour filters'. Some drawbacks:

- Limited choice in energy bands
- Lower X-ray intensity
- Multiple scans for multiple energy ranges
- ...

# (Spectral) X-ray imaging with 'Medipix3'



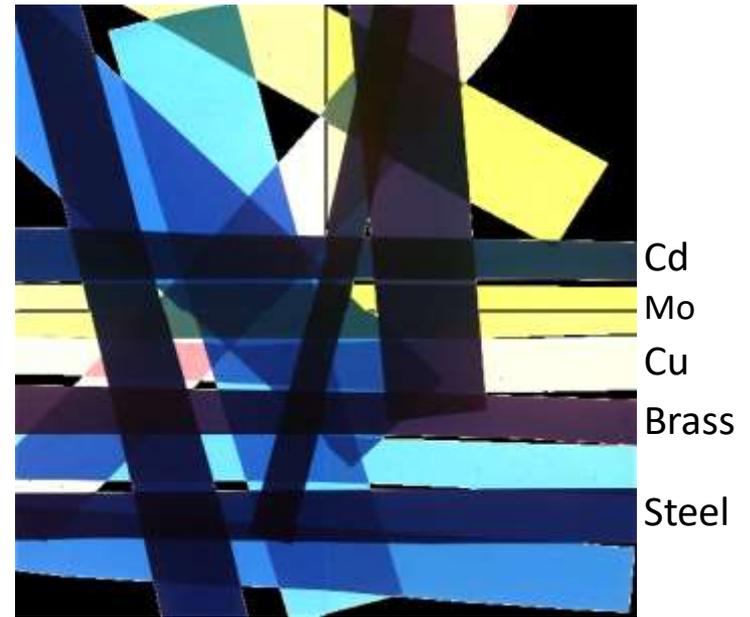
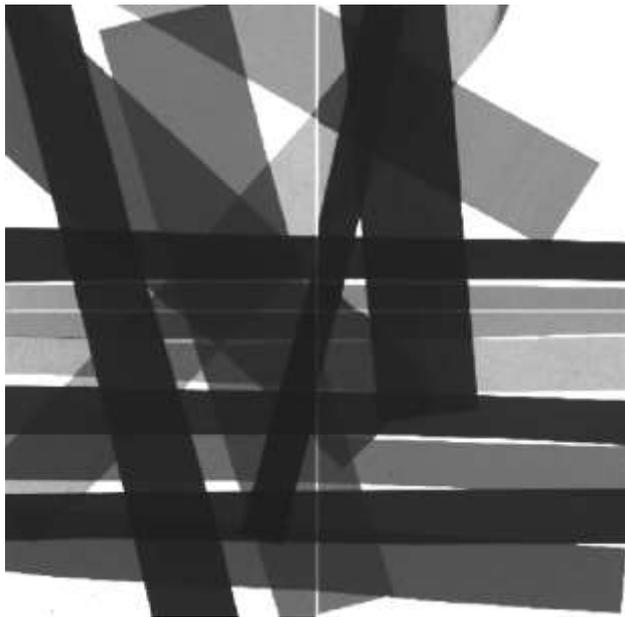
- Each absorbed X-ray photon releases charge proportional to its energy.
- Charge detected by pixels → detecting individual X-ray photons.
- Set 8 different detection thresholds → 8 energy bins.



Medipix3 detectors (electronics developed at Nikhef).

# From grey scale to spectral

Metal foils (sample 3 x 3 cm).

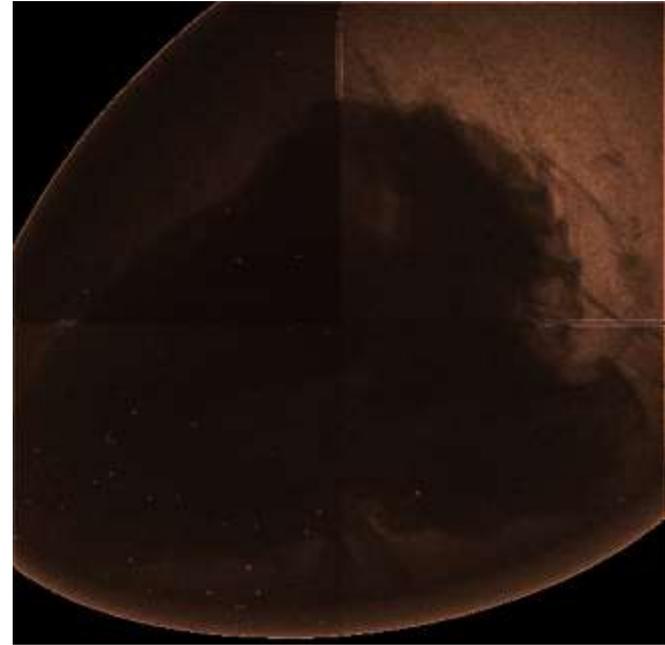


# X-ray energy scan

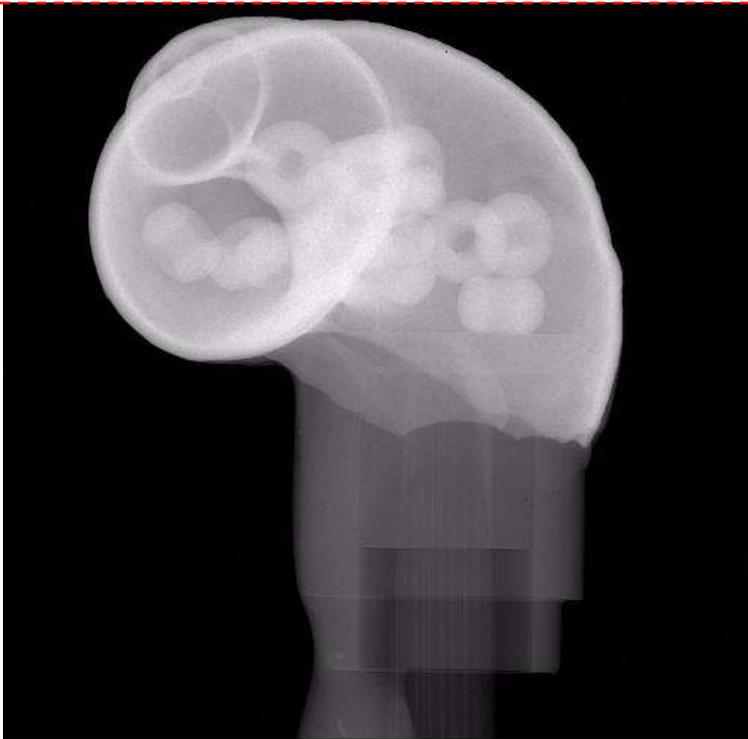
Metal foils.



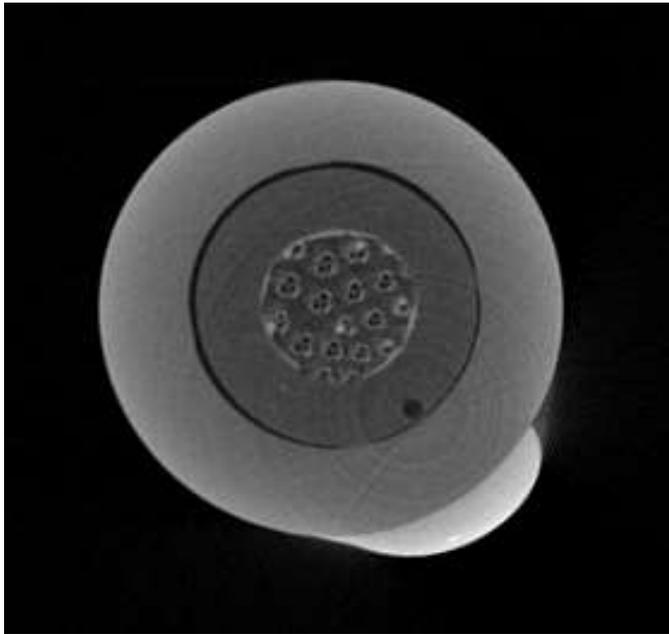
Small egg.



# Example 3d CT reconstruction

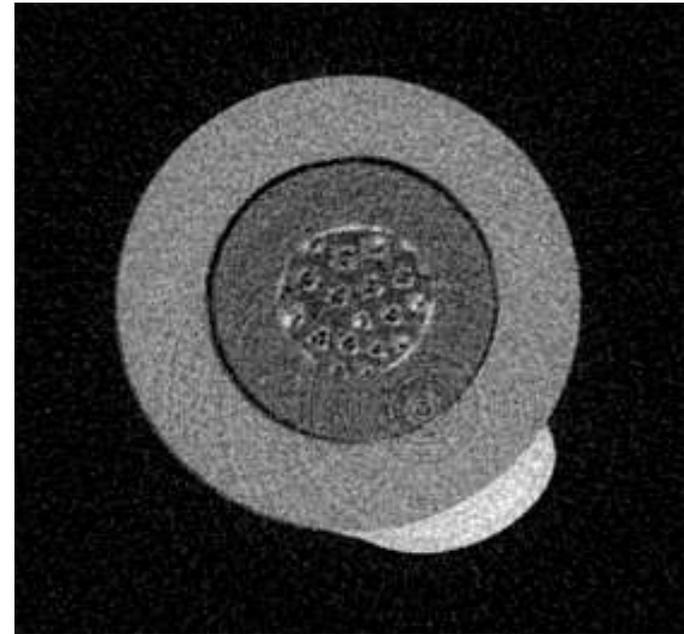


# Beam hardening and CT scans



35 keV full spectrum.

Density gradient?

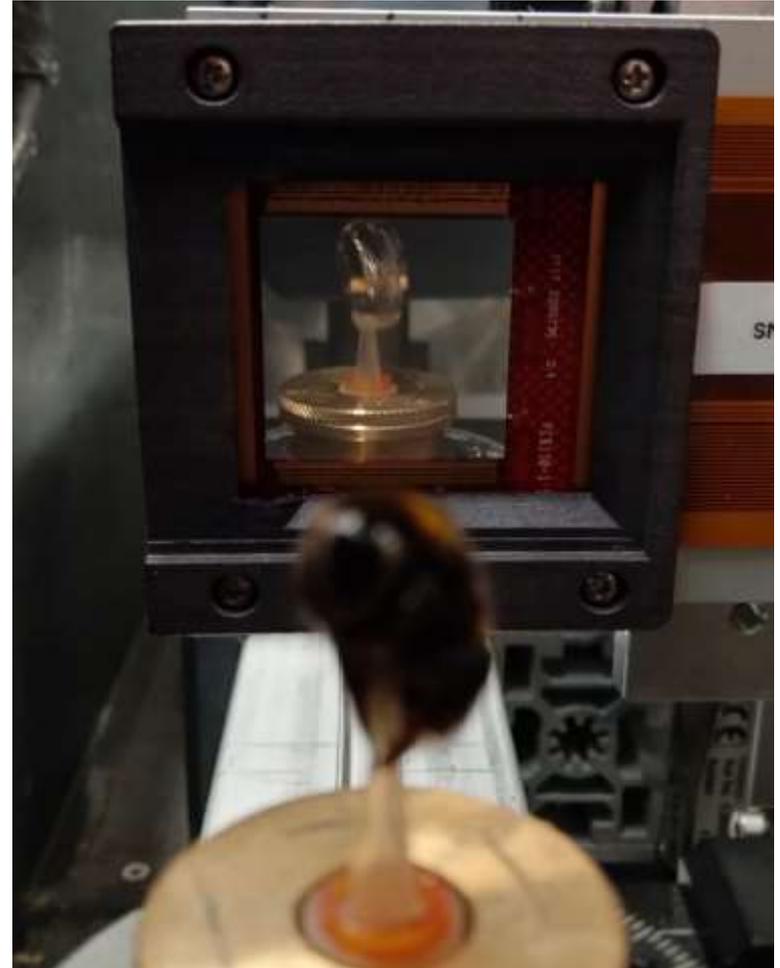


16-20 keV band.

Nope!

# Medipix3 in FleX-ray

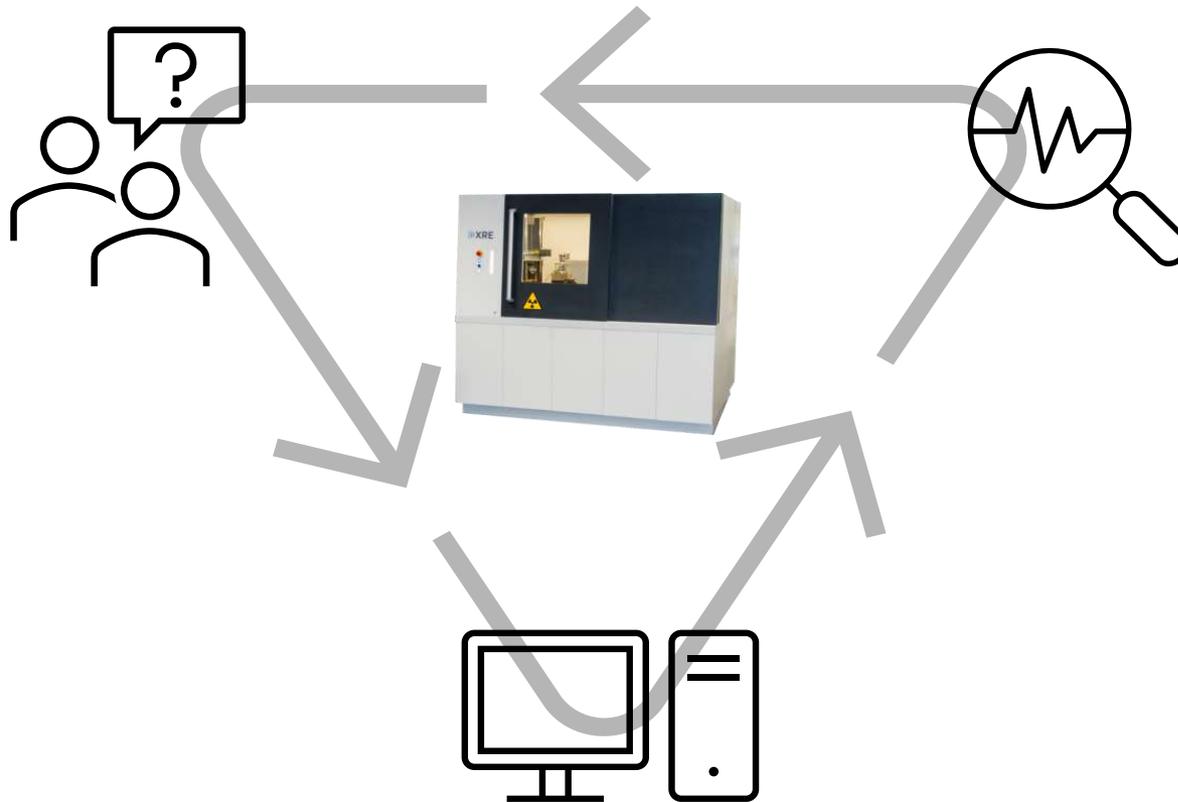
- Photon counting and energy binning.
- In addition to conventional X-ray imaging.
- Medipix3 detector in FleX-ray cabinet.
- Medipix3 based micro CT scanning set-up @ Nikhef.



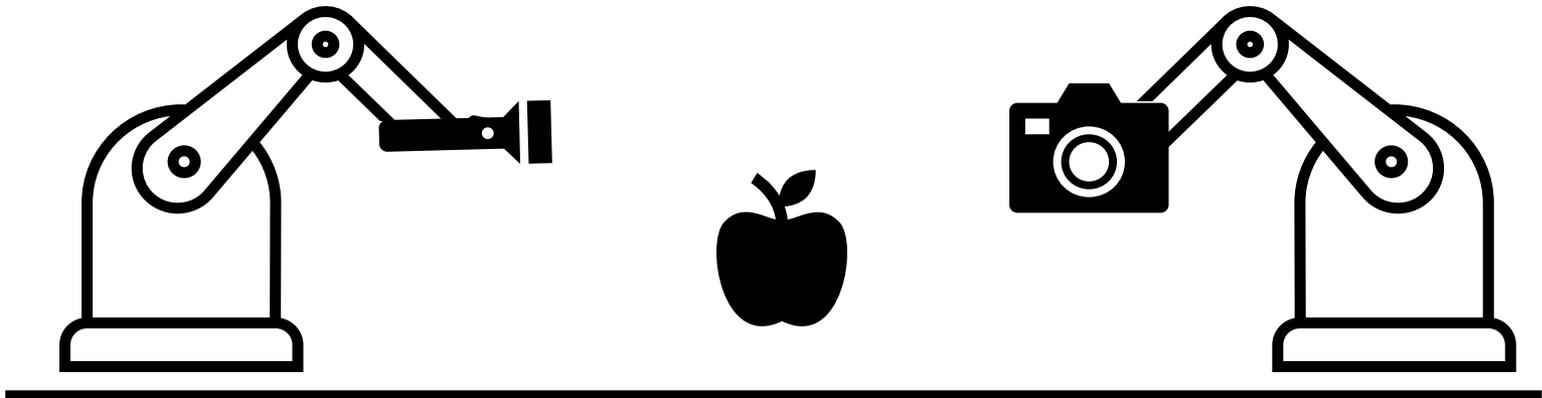
CWI

# The Future

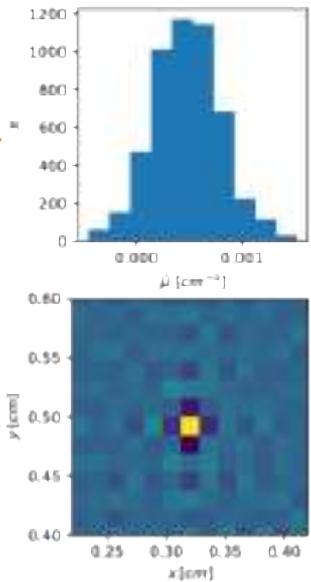
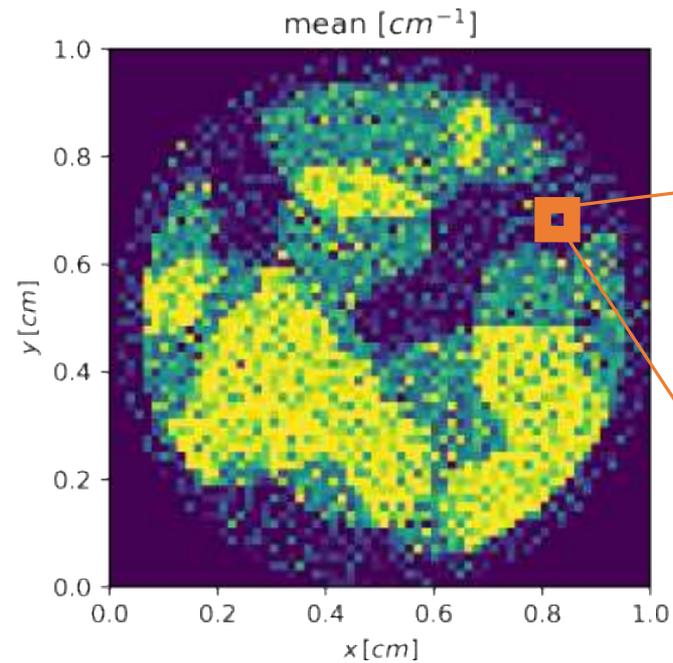
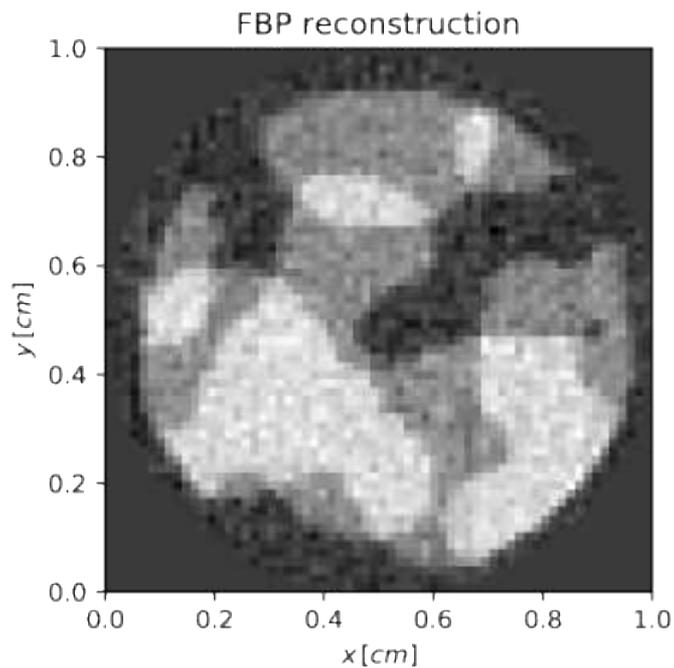
# A collaborative platform



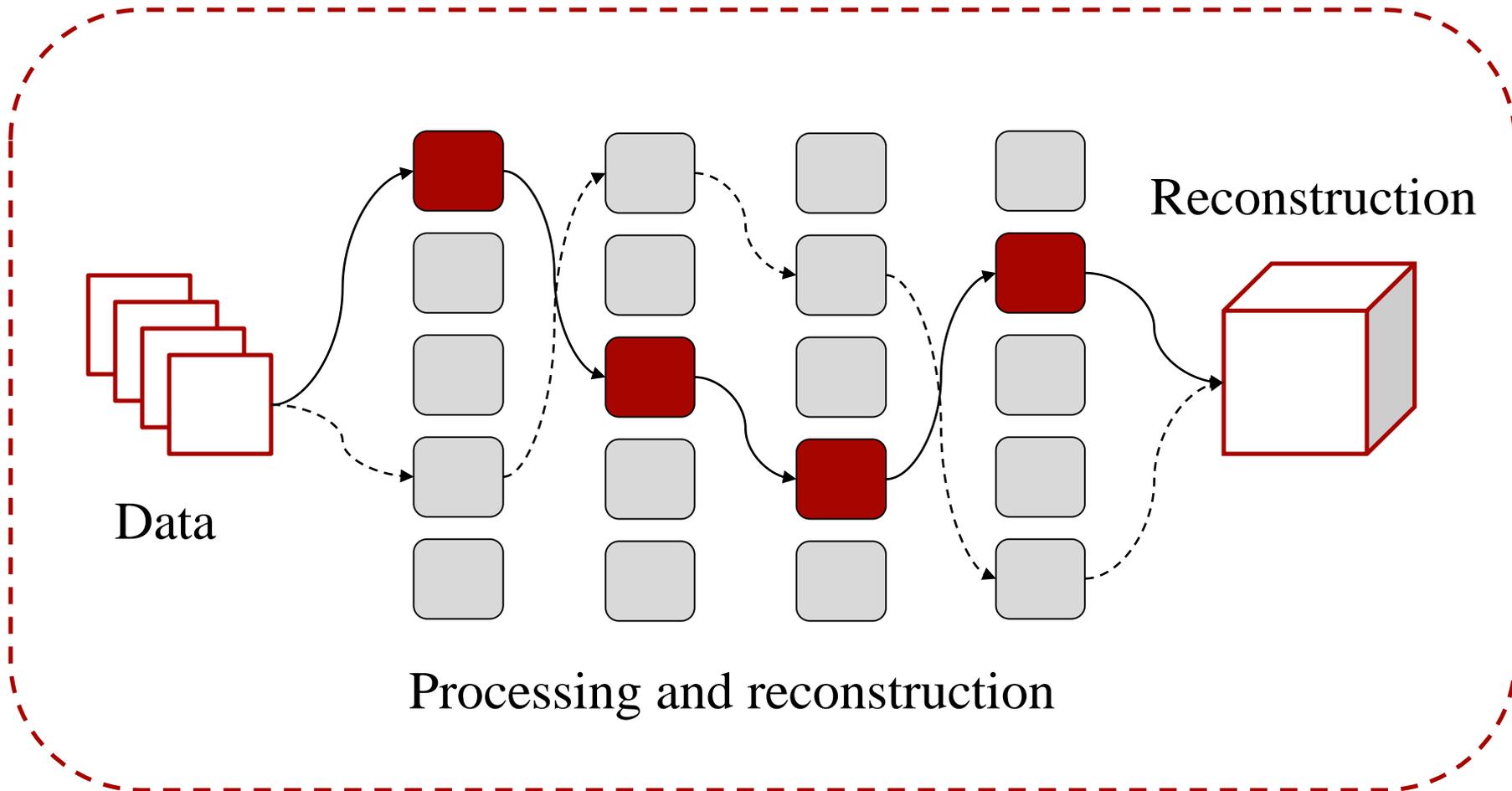
# Adaptive scanning



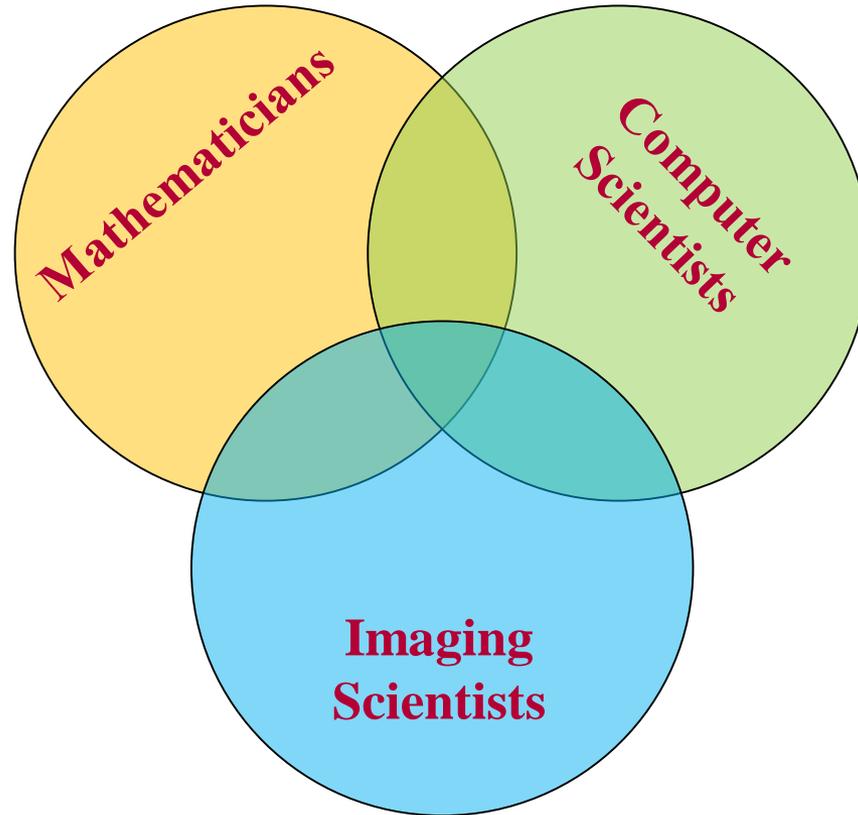
# Quantitative imaging



# Beyond images



**CWI**



# Acknowledgements

# Thanks!

- **Joost Batenburg**
- **CWI, Tescan XRE, Nikhef, ASI**
- **Sophia B. Coban & Alexander Kostenko**
- **Willem Jan Palenstijn, Navrit Bal**
- **The Computational Imaging group**

CWI

# Partners & sponsors



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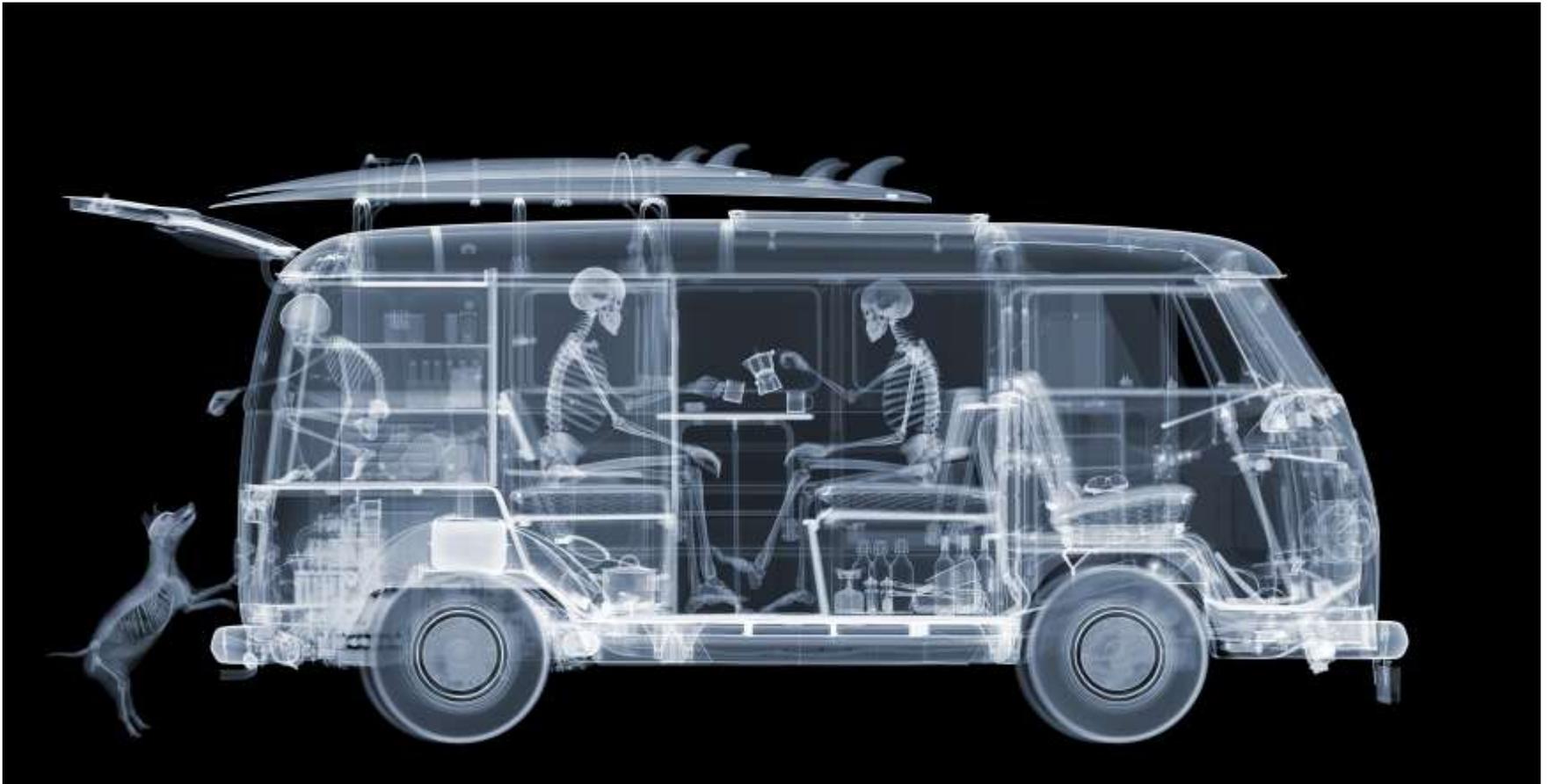
Universiteit Leiden



PLANMECA



# Tea & coffee time



Nick Veasey, VW Camper Van , 2019