

DTU

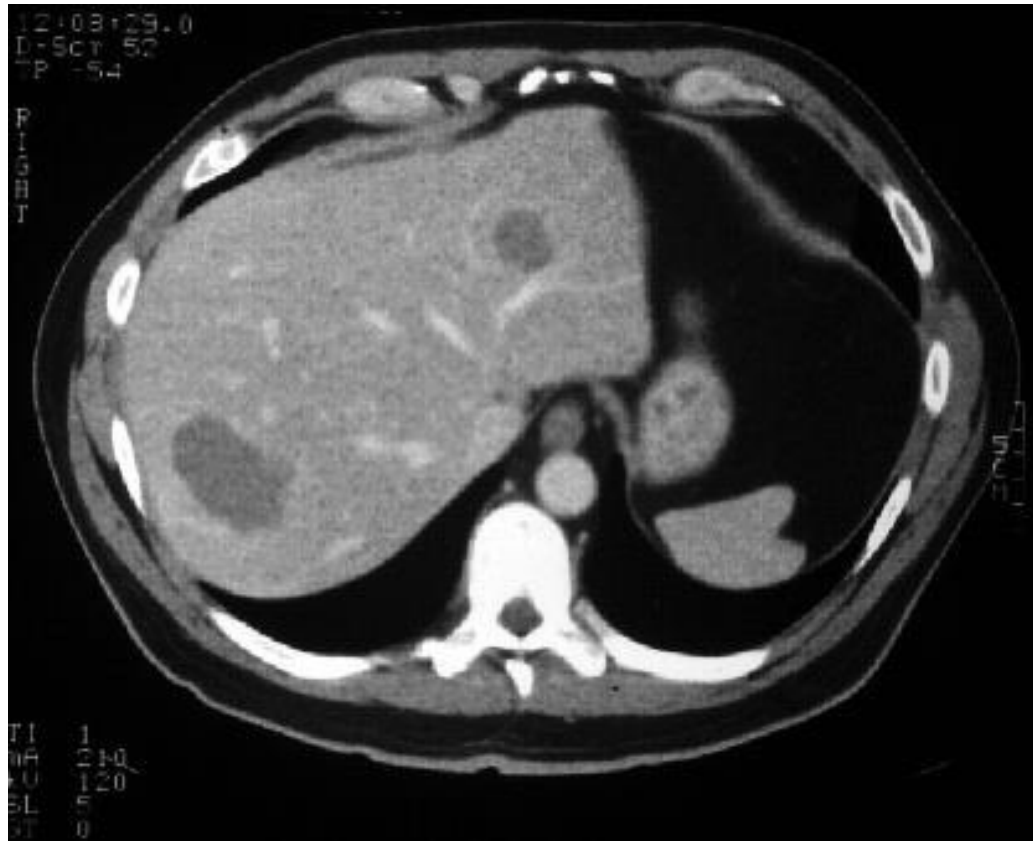


22485 lectures

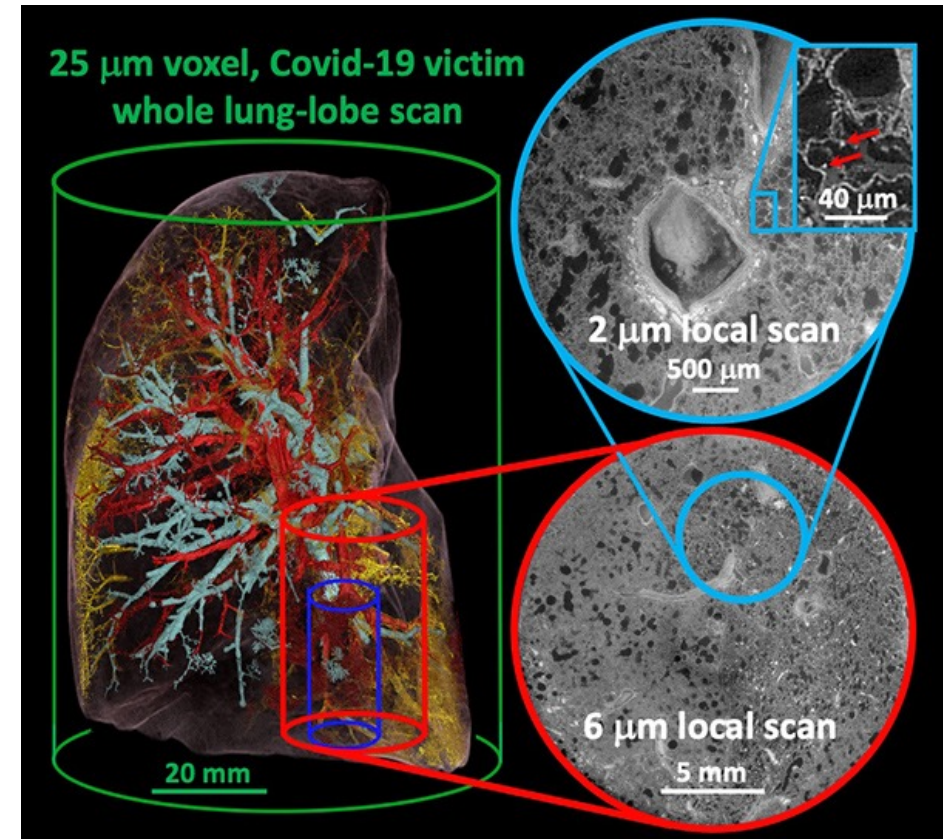
X-ray tomography

X-Ray computed tomography (CT)

Medical CT



X-ray tomography (CT)

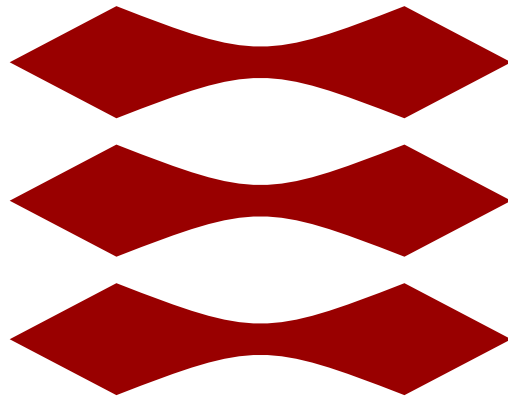


Credit: P.Tafforeau/ESRF

Plan for lecture

- Recap from X-ray physics
- Principles of X-ray tomography
- Basics of reconstructions
- Examples

DTU

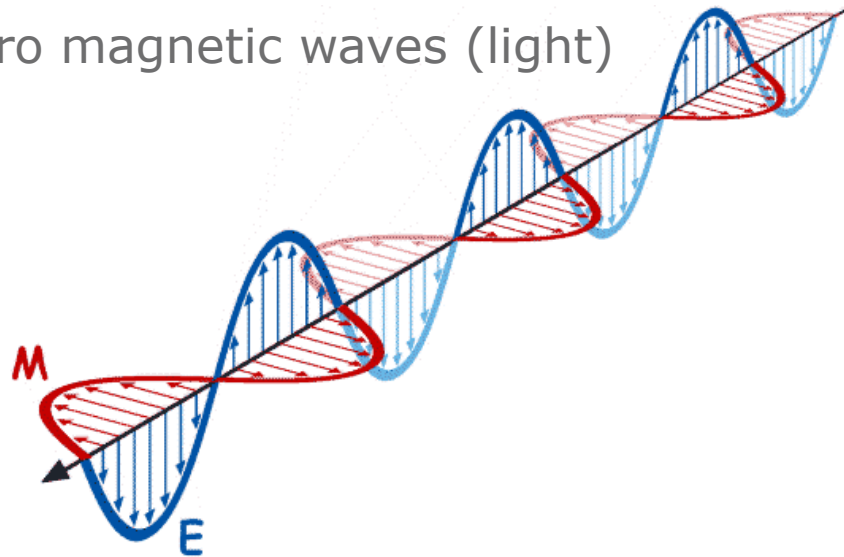


Recap of X-ray physics

X-ray properties



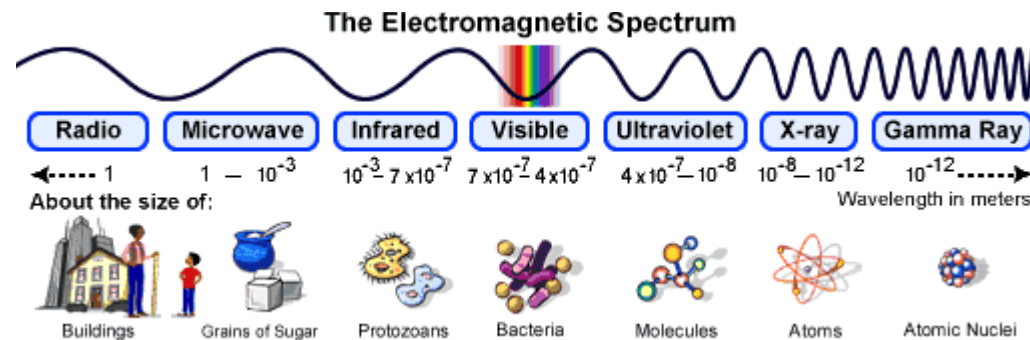
Electro magnetic waves (light)



Interference with matter:

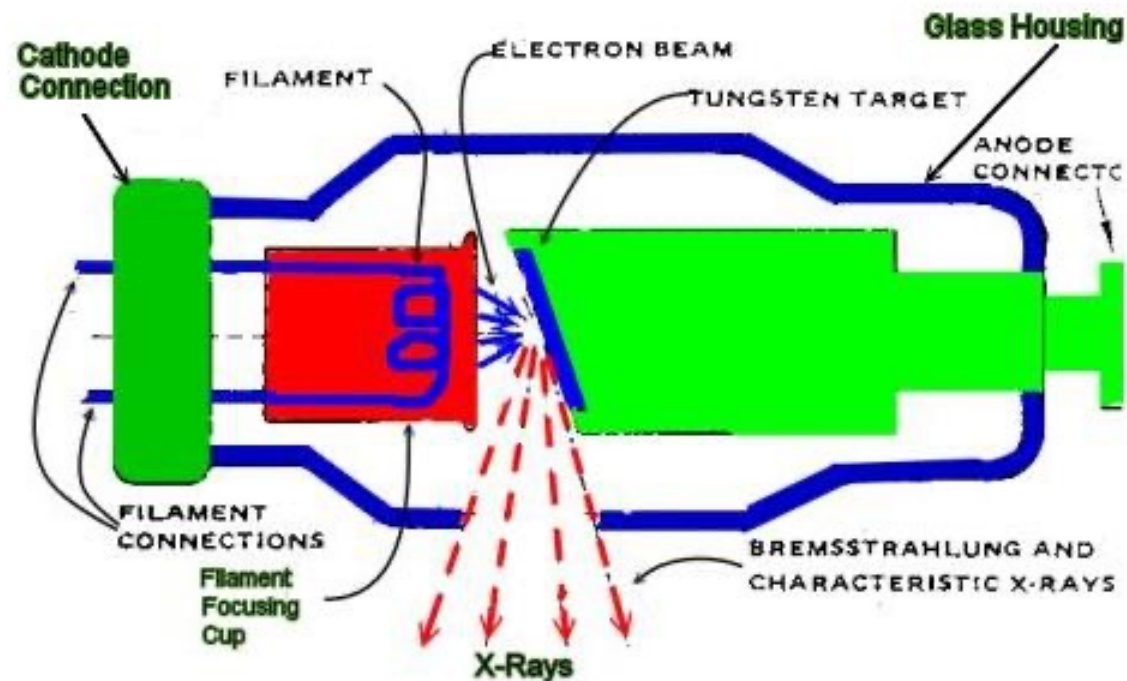
- **Scattering**
- **Photoabsorption**

Wavelength $\sim 10^{-10}$ m (1 Å)



X-ray Generation

- Electrons are emitted by a cathode, strike an anode containing a target material.
- Electrons excite the atoms in the target material, which release energy in the X-ray spectrum



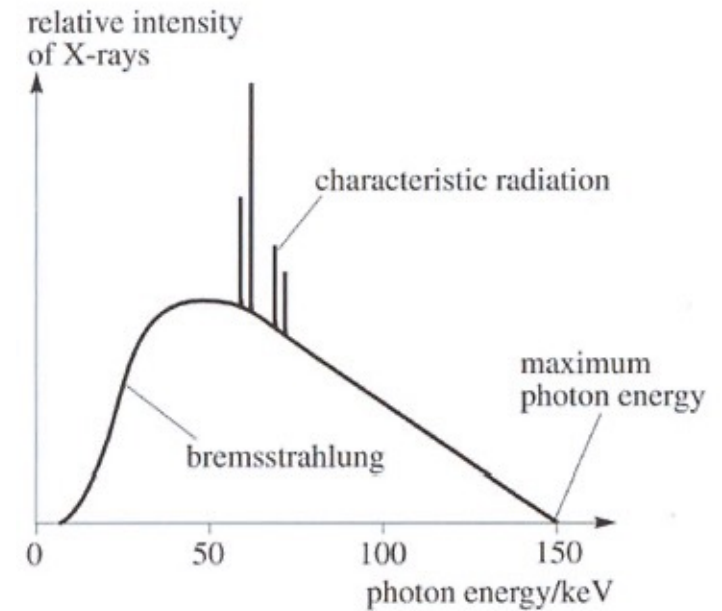
Target Materials & X-ray Spectra

- Different target materials produce different characteristic emission lines, as well as different broad-band emission spectra all the way up to the accelerating voltage (*bremstrahlung*)
- Common target materials:
 - **Tungsten (W)**, Copper (Cu), Vanadium (V), Chromium (Cr), Molybdenum(Mo)

Element	K α_1	K α_2	K β_1	L α_1	L α_2	L β_1	L β_2	L γ_1	M α_1
63 Eu	41,542.2	40,901.9	47,037.9	5,845.7	5,816.6	6,456.4	6,843.2	7,480.3	1,131
64 Gd	42,996.2	42,308.9	48,697	6,057.2	6,025.0	6,713.2	7,102.8	7,785.8	1,185
65 Tb	44,481.6	43,744.1	50,382	6,272.8	6,238.0	6,978	7,366.7	8,102	1,240
66 Dy	45,998.4	45,207.8	52,119	6,495.2	6,457.7	7,247.7	7,635.7	8,418.8	1,293
67 Ho	47,546.7	46,699.7	53,877	6,719.8	6,679.5	7,525.3	7,911	8,747	1,348
68 Er	49,127.7	48,221.1	55,681	6,948.7	6,905.0	7,810.9	8,189.0	9,089	1,406
69 Tm	50,741.6	49,772.6	57,517	7,179.9	7,133.1	8,101	8,468	9,426	1,462
70 Yb	52,388.9	51,354.0	59,370	7,415.6	7,367.3	8,401.8	8,758.8	9,780.1	1,521.4
71 Lu	54,069.8	52,965.0	61,283	7,655.5	7,604.9	8,709.0	9,048.9	10,143.4	1,581.3
72 Hf	55,790.2	54,611.4	63,234	7,899.0	7,844.6	9,022.7	9,347.3	10,515.8	1,644.6
73 Ta	57,532	56,277	65,223	8,146.1	8,087.9	9,343.1	9,651.8	10,895.2	1,710
74 W	59,318.24	57,981.7	67,244.3	8,397.6	8,335.2	9,672.35	9,961.5	11,285.9	1,775.4
75 Re	61,140.3	59,717.9	69,310	8,652.5	8,586.2	10,010.0	10,275.2	11,685.4	1,842.5
76 Os	63,000.5	61,486.7	71,413	8,911.7	8,841.0	10,355.3	10,598.5	12,095.3	1,910.2
77 Ir	64,895.6	63,286.7	73,560.8	9,175.1	9,099.5	10,708.3	10,920.3	12,512.6	1,979.9
78 Pt	66,832	65,112	75,748	9,442.3	9,361.8	11,070.7	11,250.5	12,942.0	2,050.5
79 Au	68,803.7	66,989.5	77,984	9,713.3	9,628.0	11,442.3	11,584.7	13,381.7	2,122.9
80 Hg	70,819	68,895	80,253	9,988.8	9,897.6	11,822.6	11,924.1	13,830.1	2,195.3
81 Tl	72,871.5	70,831.9	82,576	10,268.5	10,172.8	12,213.3	12,271.5	14,291.5	2,270.6

X-ray emission lines for various elements

Source: X-ray Data Booklet (xdb.lbl.gov)

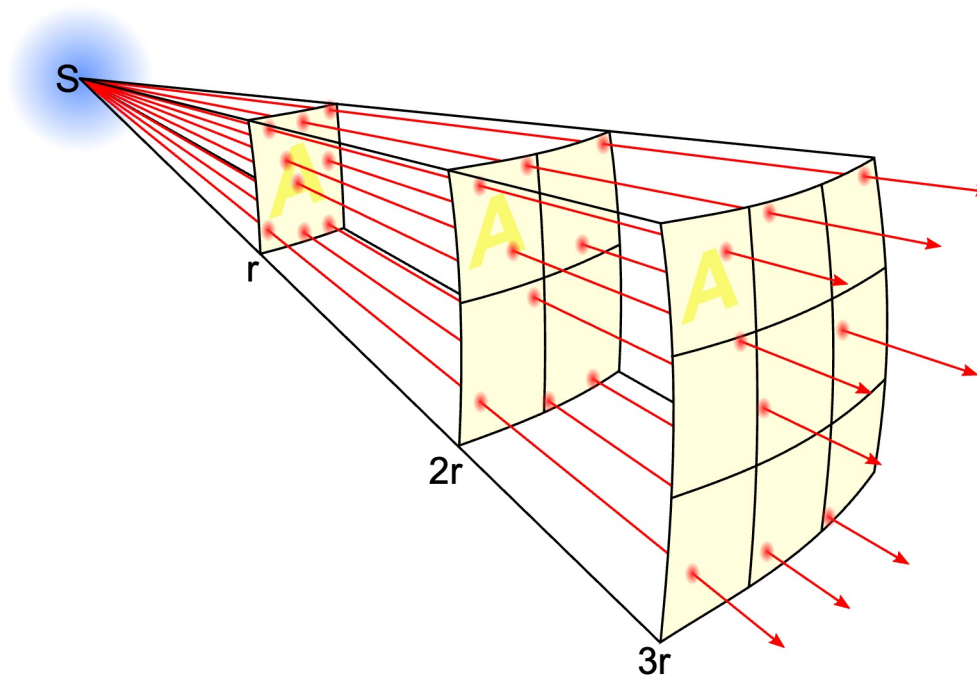


X-ray emission from a W laboratory X-ray source

Source: labspace.open.ac.uk

Radiation path

- How can you describe the radiation path with increasing distance from source?



Inverse square law:

$$A \propto \frac{1}{r^2}$$

Figure from https://en.wikipedia.org/wiki/Inverse-square_law

Geometry and magnification

D = detector size

d = sample size

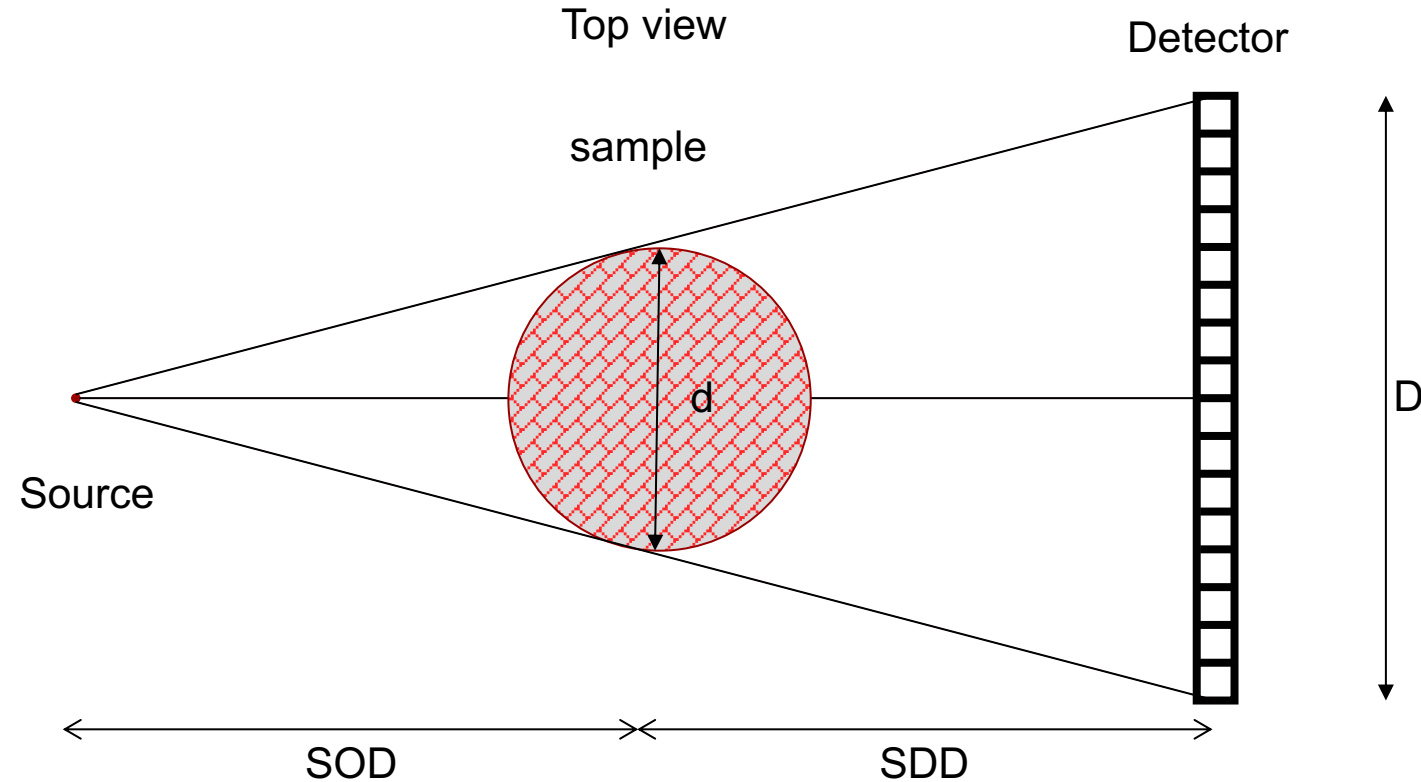
FOD = distance from source to object

SDD = distance from source to detector

M = magnification

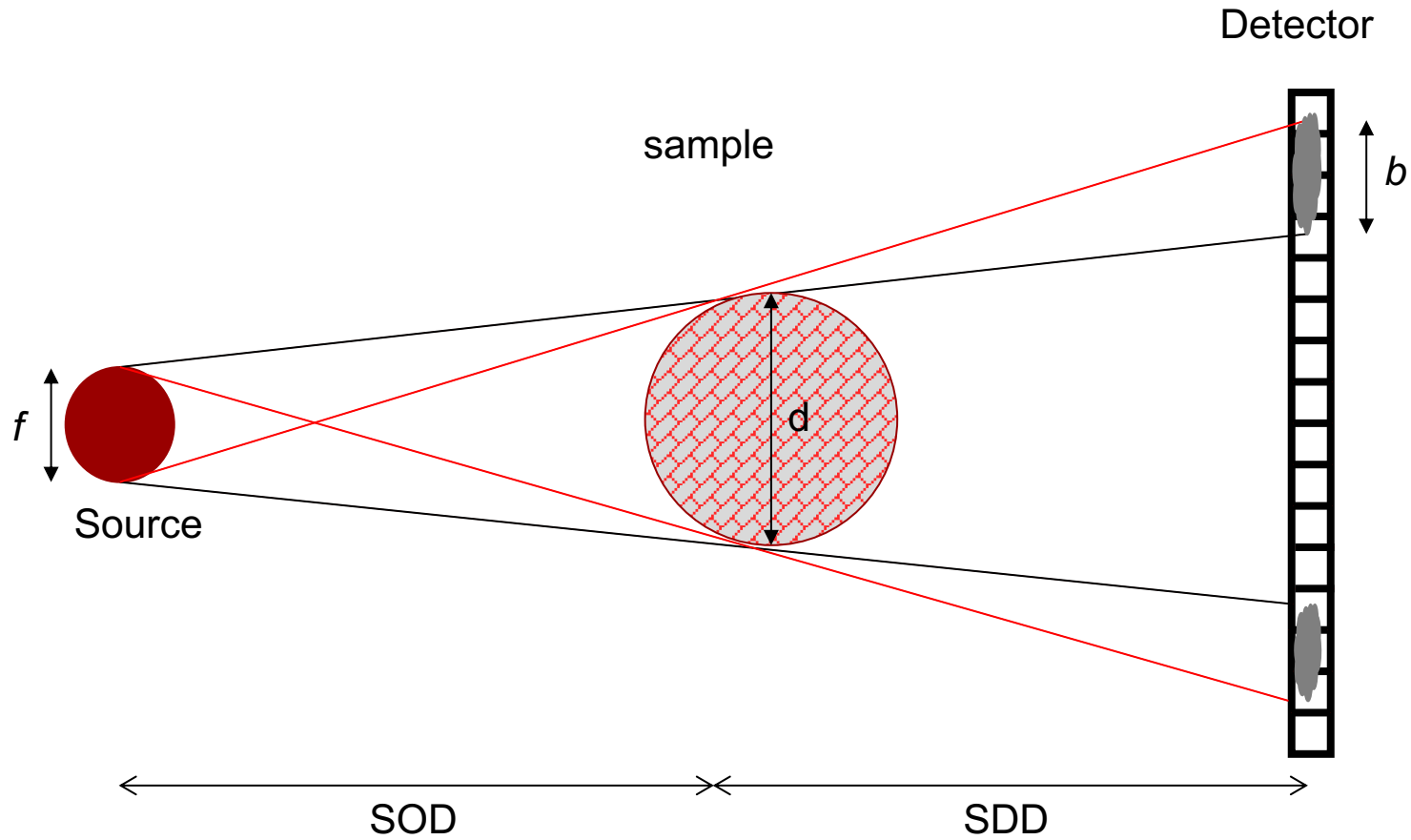
dis = pixel to pixel distance/pixel pitch

vs = efficient pixel size



$$M = \frac{SDD + SOD}{SOD} \quad M_{Max} = \frac{D}{d} \quad vs = \frac{dis}{M}$$

Geometric spot blurring effect



$$\frac{f}{SOD} = \frac{b}{SDD}$$

Magnification, M :

$$M = \frac{SDD + SOD}{SOD}$$

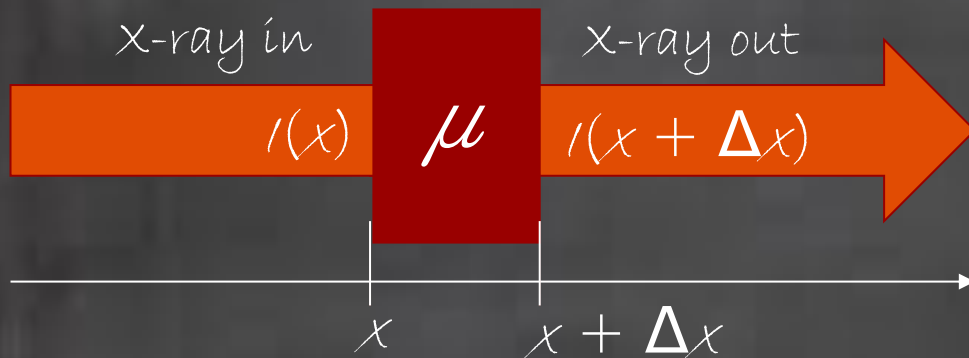


$$b = f(M - 1)$$

The image resolution is limited by the blurring effect

Beer-Lamberts law

For a homogeneous medium with a constant attenuation coefficient, μ



$$I(x) = I_0 e^{-\mu x}$$

I_0 = initial intensity

$$\text{absorption} \propto \frac{Z^4}{\epsilon^3}$$

Beer-lambert law for non homogenous materials



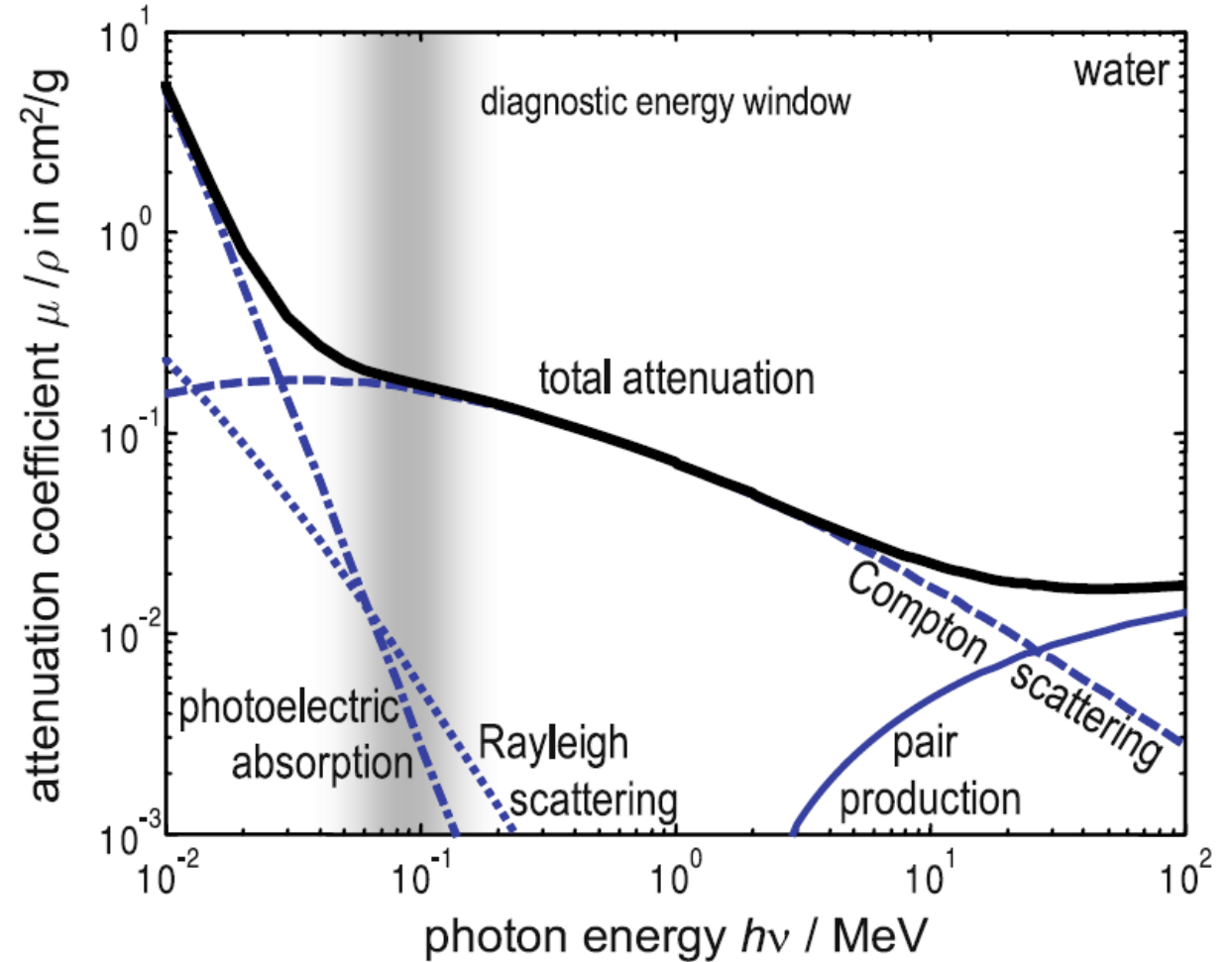
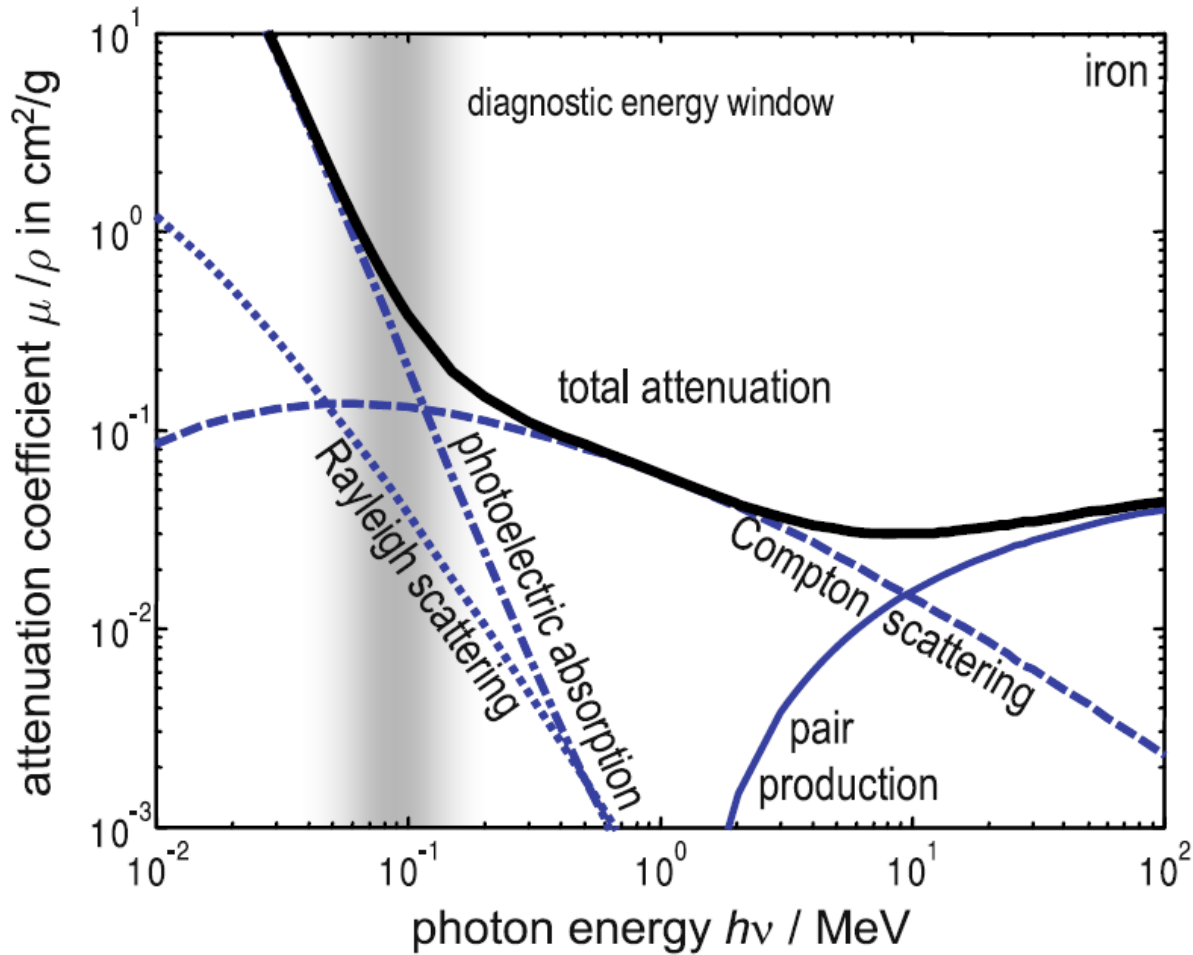
As seen the X-ray spectrum from most X-ray sources are not a monochromatic spectrum and as a result, we need to calculate the attenuation for each energies in the spectrum

We then include an integral over the energy range

$$I(x) = \int I_0 e^{-\int \mu(x) dx} dE$$


$$\text{photoelectric absorption: } \alpha = k \frac{\rho}{A} \frac{Z^4}{(h\omega)^3}$$

How much does each mechanism contribute?




Reference: Thorsten M. Buzug Computed Tomography

X-rays



19 Nobel Prizes
Based on X-ray Work



CHEMISTRY:

- 1936 – Peter Debye
- 1962 – Max Perutz & Sir John Kendrew
- 1964 – Dorothy Hodgkin
- 1976 – William Lipscomb
- 1985 – Herbert Hauptman & Jerome Karle
- 1988 – **Johann Deisenhofer, Robert Huber & Hartmut Michel***
- 1997 – **Paul D. Boyer & John E. Walker***
- 2003 – **Peter Agre & Roderick Mackinnon***
- 2006 – **Roger Kornberg***

PHYSICS:

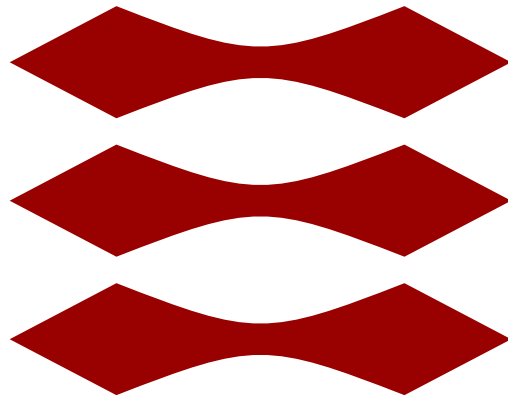
- 1901 – Wilhelm Röntgen
- 1914 – Max Von Laue
- 1915 – Sir William Henry Bragg & Sir William Lawrence Bragg
- 1917 – Charles Barkla
- 1924 – Karl Manne Siegbahn
- 1927 – Arthur Compton
- 1981 – Kai Siegbahn

MEDICINE:

- 1946 – Hermann Joseph Muller
- 1962 – Francis Crick, James Watson & Maurice Wilkins
- 1979 – Alan M. Cormack & Sir Godfrey N. Hounsfield

* Used SYNCHROTRON RADIATION

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Principles of X-ray tomography

What is X-ray CT?

- CT: Computed Tomography
- The word *tomography* is derived from the Greek *tomē* ("cut") or *tomos* ("part" or "section") and *graphein* ("to write").
- It refers to imaging by sections or sectioning, through the use of waves of energy, first proposed in the early 1900s
- 1970's introduced the use of computers to do tackle the extensive math required
- In the medical field, it is also called CAT or Computerize Axial Tomography.

History of tomography

Mathematics behind CT been developed in the early 19th century by Bockwinkel, Radon, Ehrenfest, Cramer, Wold and more.
Development of the Radon transform by Johann Radon in 1917¹



Theoretic framework for medical CT by Allan Cormack in 1963²



First full body scanner build by Godfrey Hounsfield in 1975, at EMI

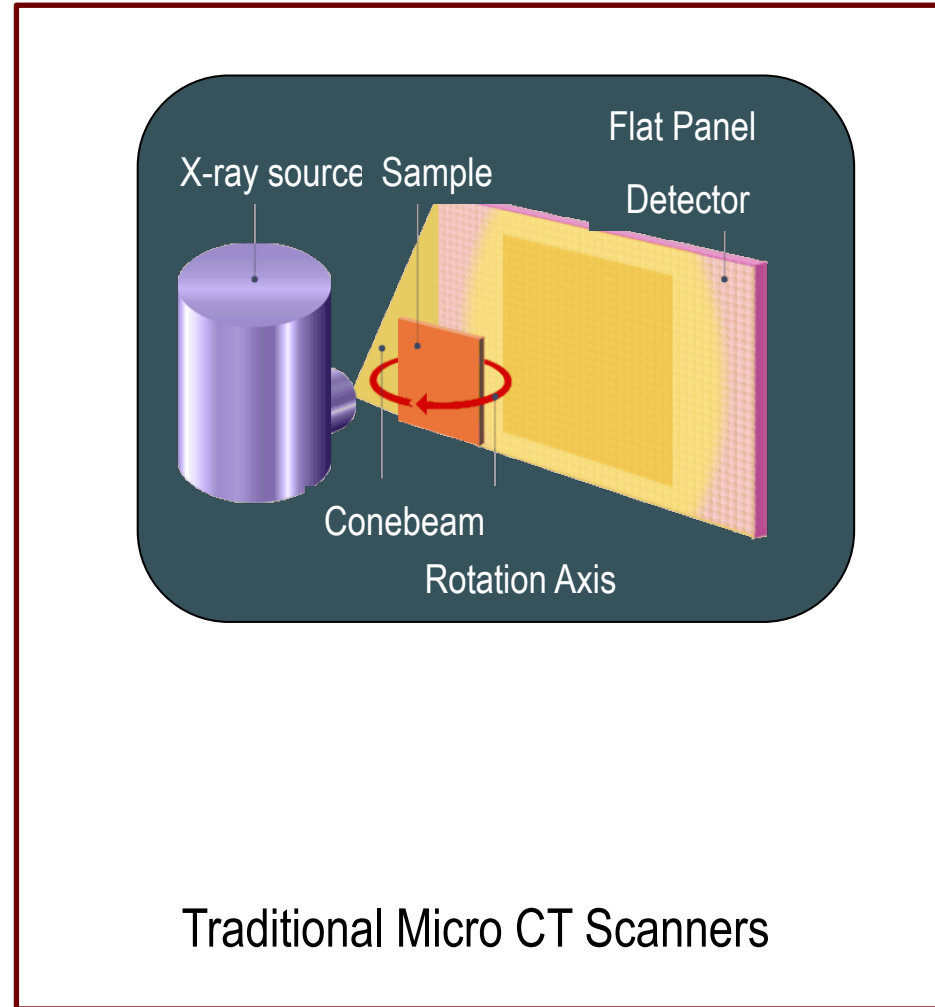
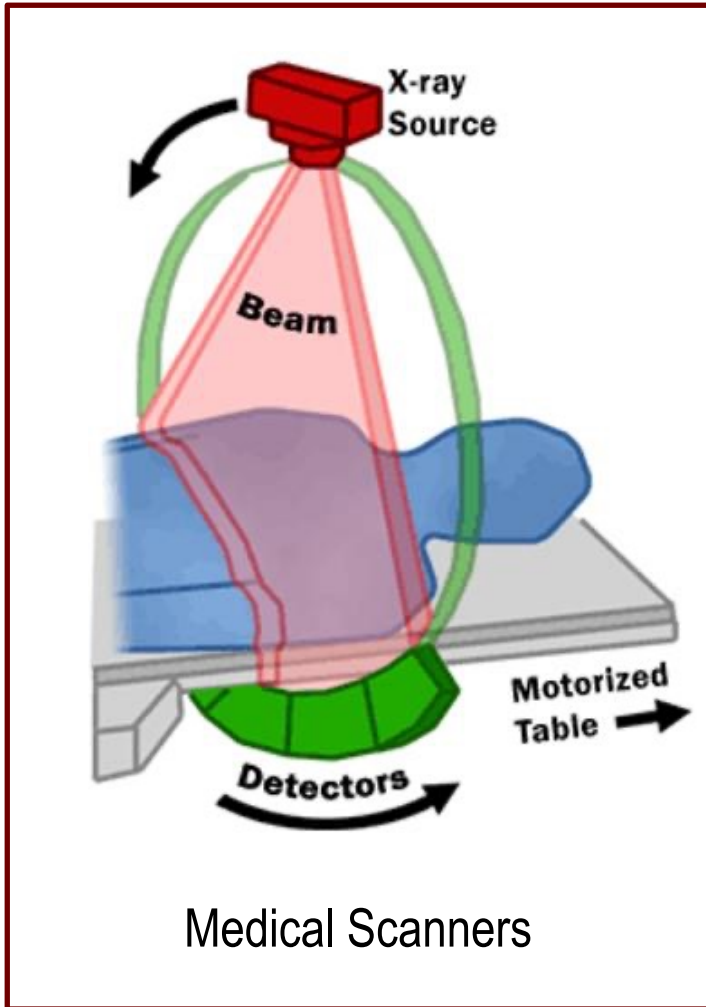


¹"Über die Bestimmung von Funktionen durch ihre Integralwerte längs gewisser Mannigfaltigkeiten",

Reports on the Proceedings of the Royal Saxonian Academy of Sciences at Leipzig, Mathematical and Physical Section], Leipzig: Teubner (69): 262–277

²"Representation of a function by its line integrals, with some radiological applications." J Appl Physics. 1963; 34: 2722-2727

Standard Architecture of CT



Medical CT development

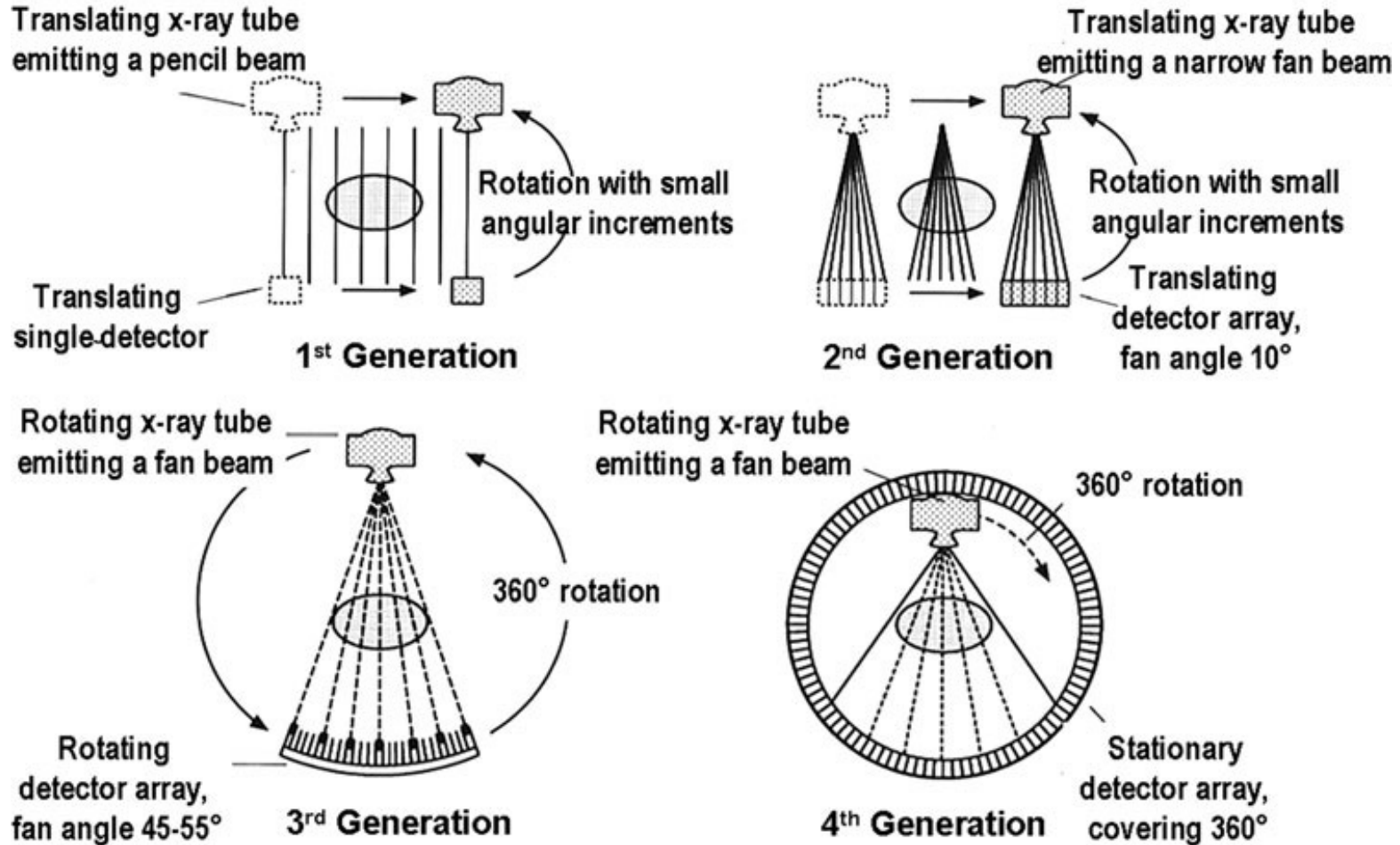


Figure 1 from Curr Radiol Rep (2013) 1:52–63, DOI 10.1007/s40134-012-0005-5

Industrial and micro CT



Inside the box

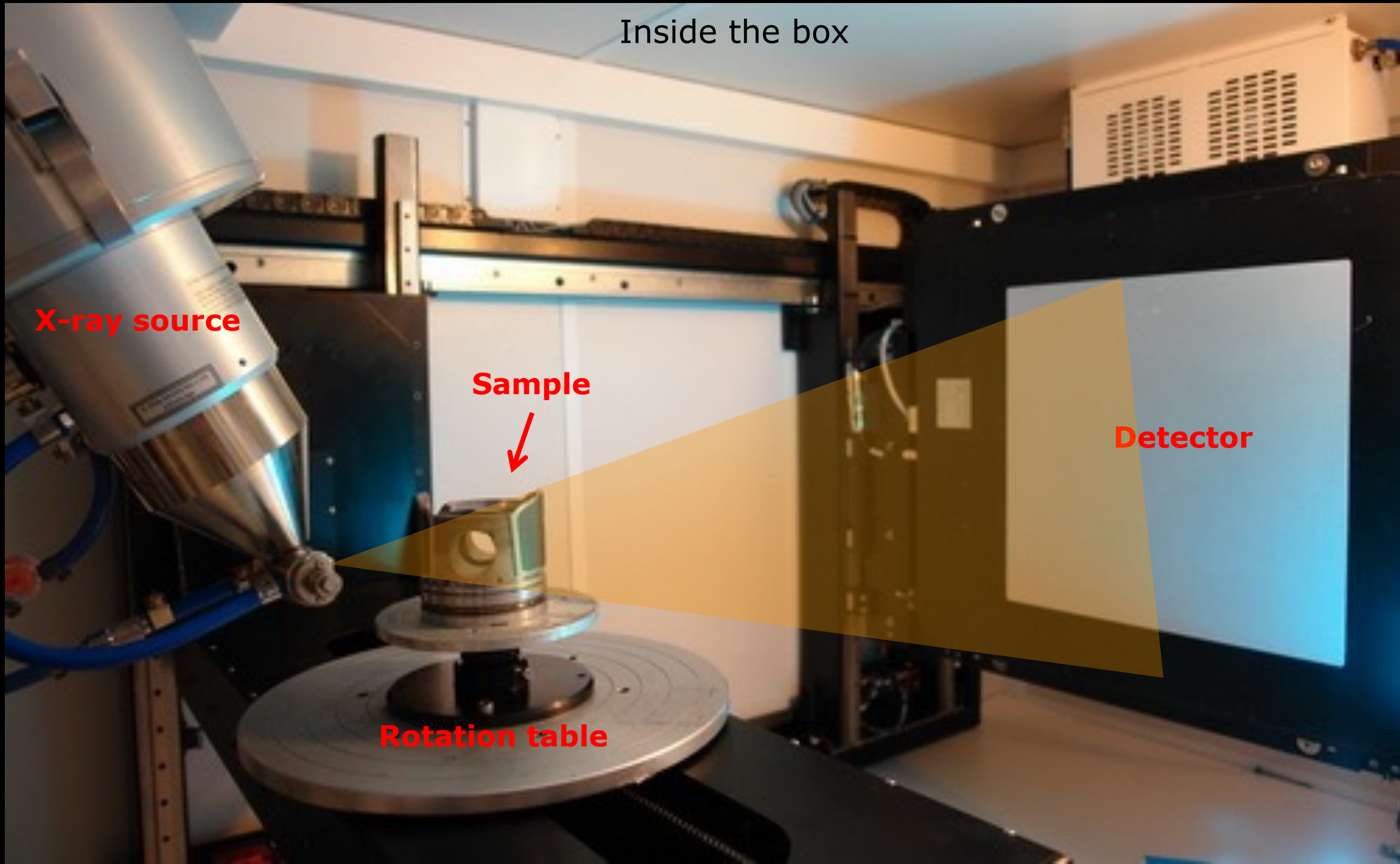
X-ray source

Sample



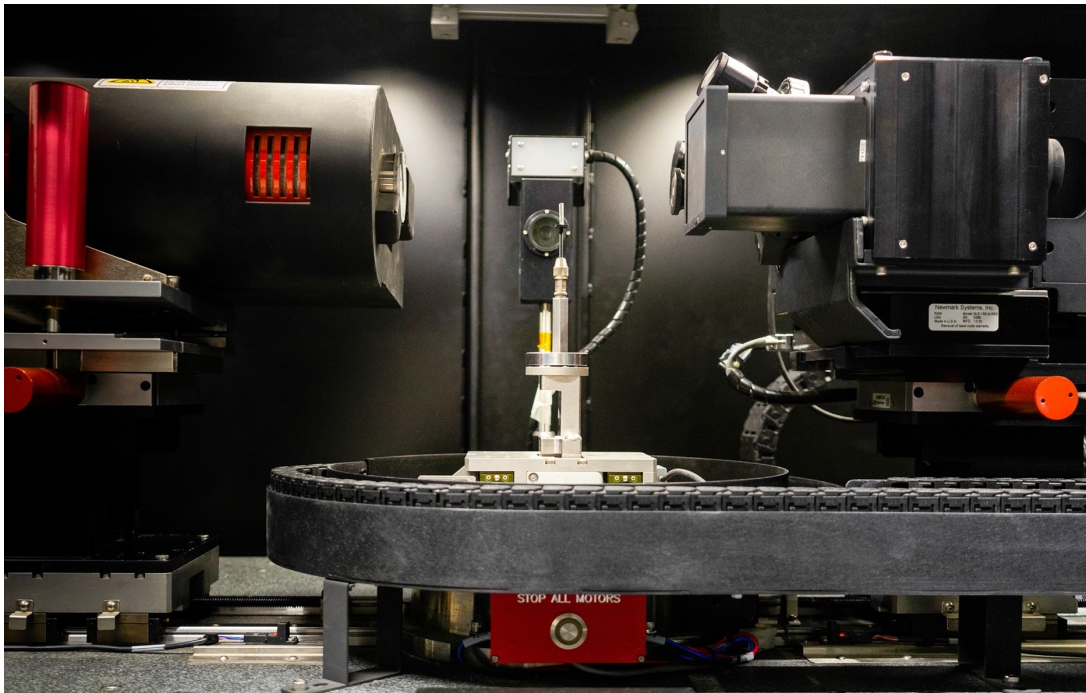
Detector

Rotation table



X-ray divergence

Lab sources



One of our scanners at DTU 3D imaging center
Divergence up to 10s of degrees

Large scale facilities



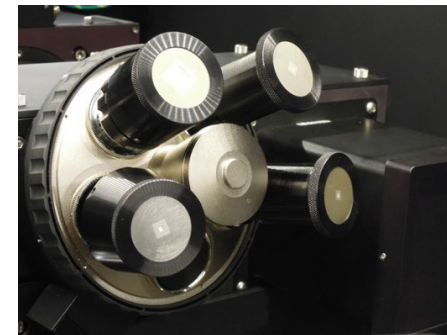
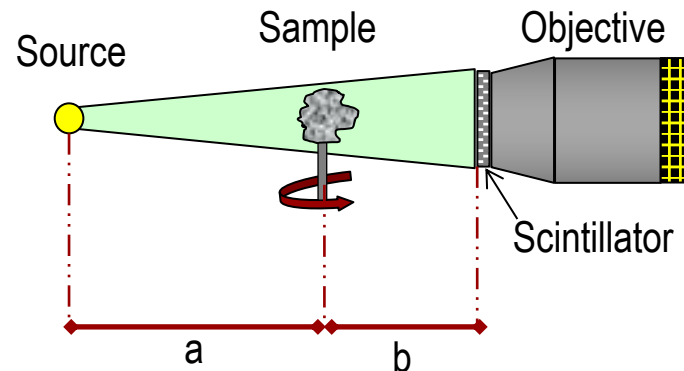
The synchrotron MAX IV in Lund, Sweden
Divergence measured in mrad

Add optical magnification to the system

- Image resolution given by is mainly defined by geometric magnification **AND** objectives

Total Magnification = Optical magnification * Geometric magnification

$$\text{Geometric magnification} = \frac{\text{Source to detector distance}}{\text{Source to sample distance}} = \frac{a + b}{a}$$



Electron tomography

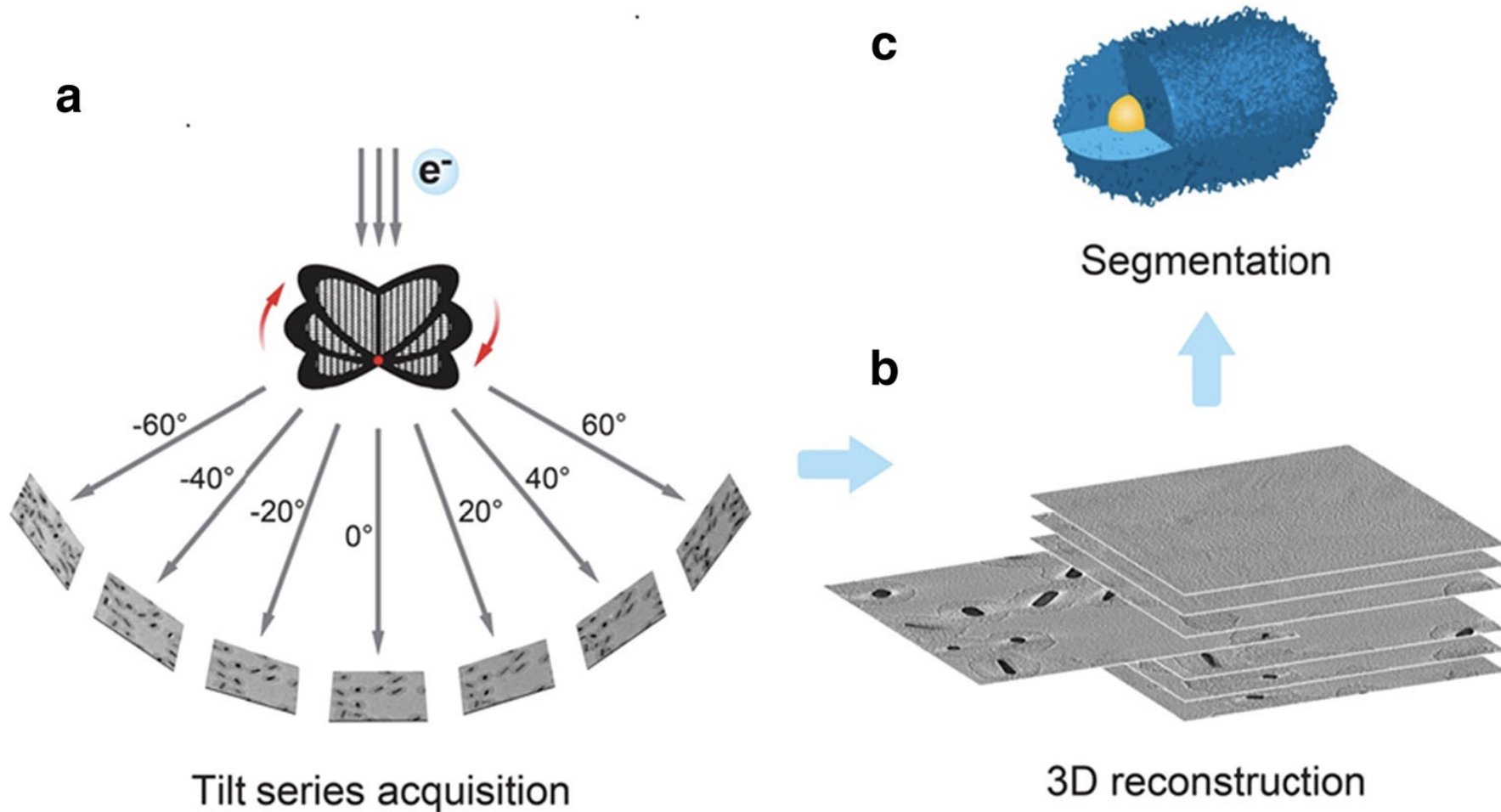
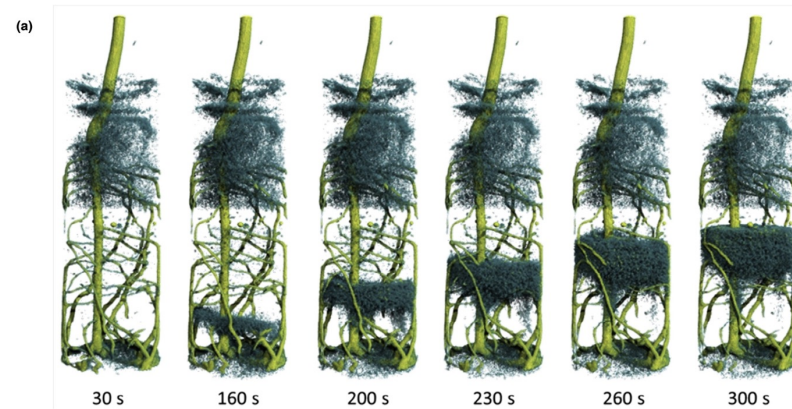
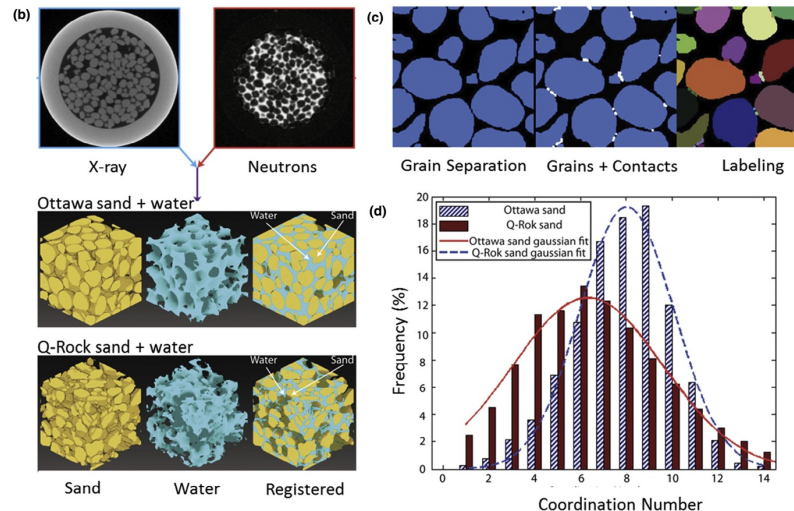


Figure from Colloid and Polymer Science (2020) 298:707–717, <https://doi.org/10.1007/s00396-020-04657-w>

Neutron tomography



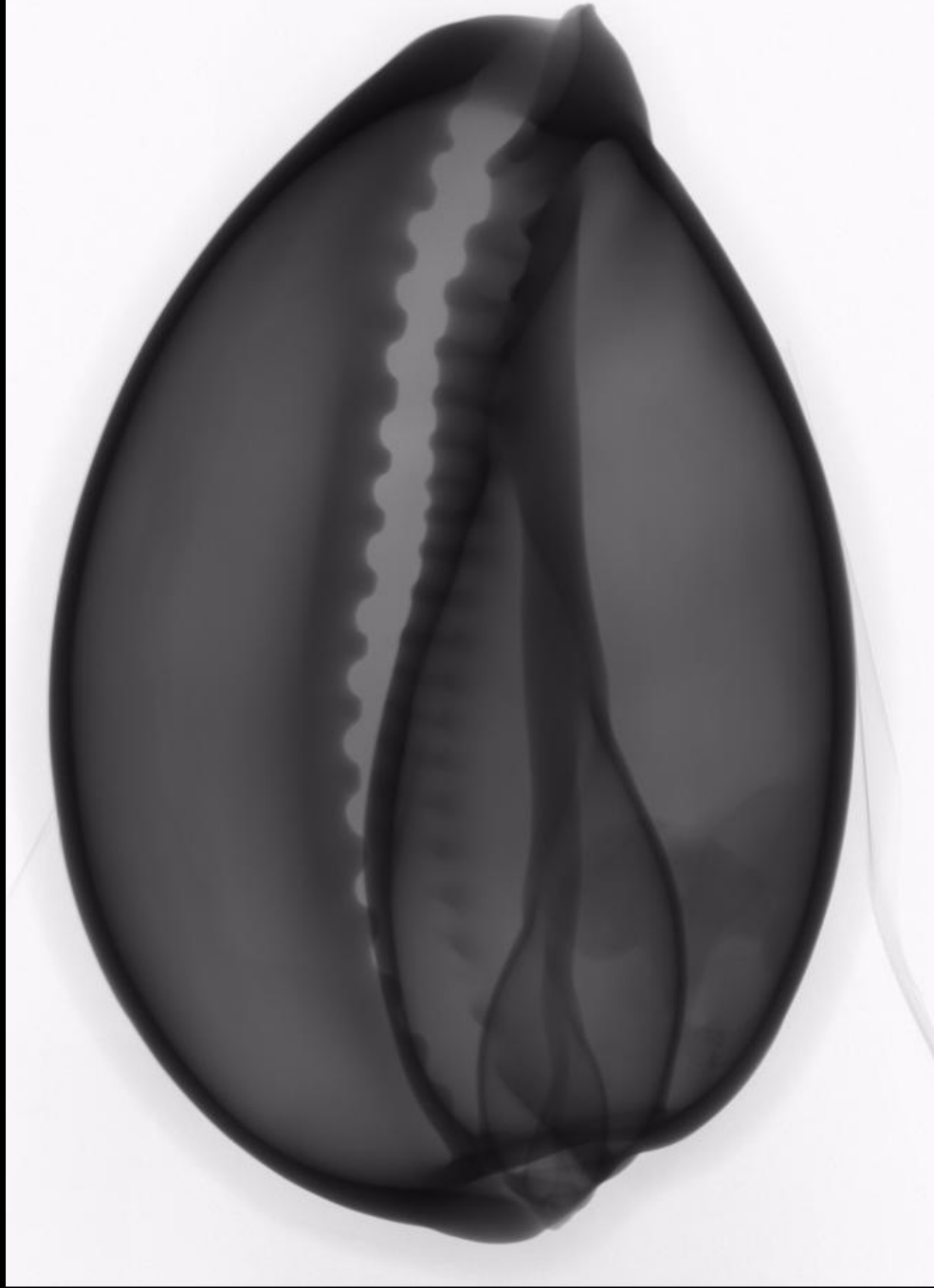
Water transport in roots of plants



Sand grains and voids

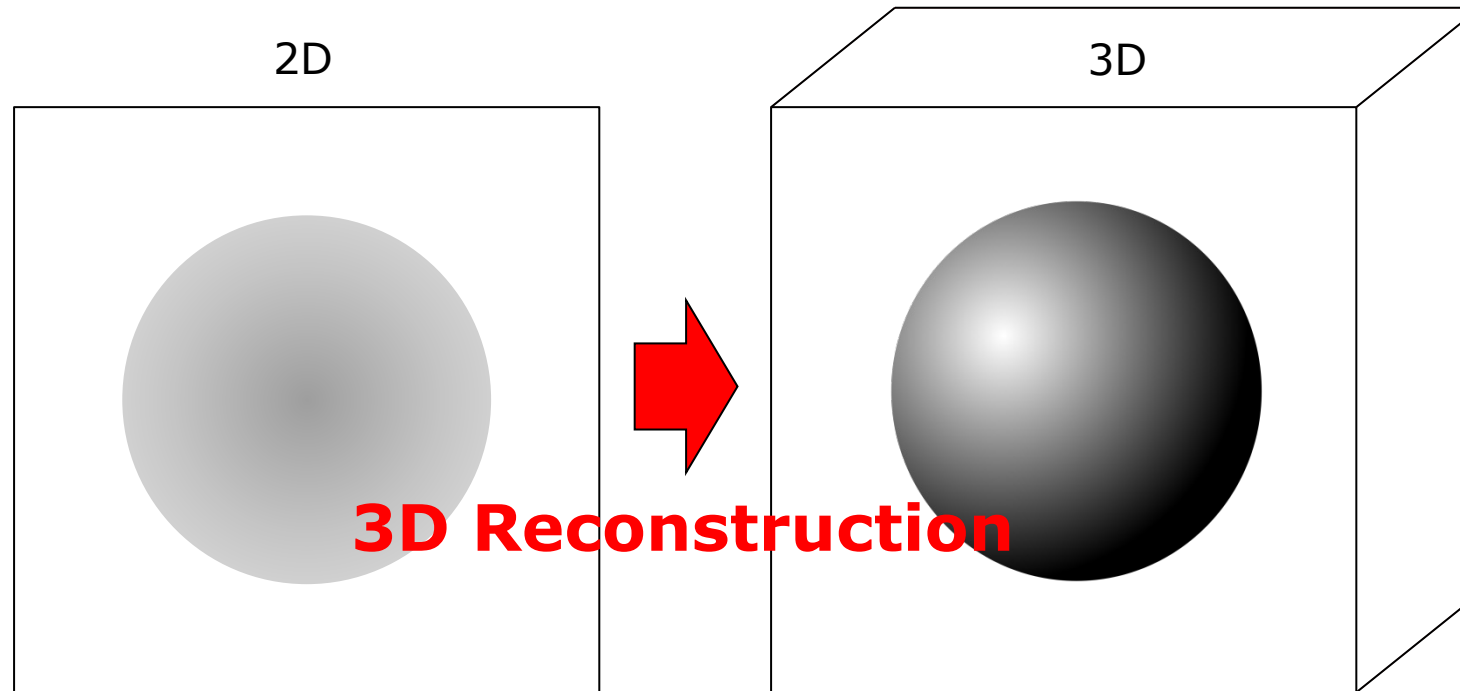
Figure from Materials today Volume 21, Issue 6, July–August 2018, Pages 652-672, <https://doi.org/10.1016/j.mattod.2018.03.001>

1571 radiograms recorded over a 360° rotation



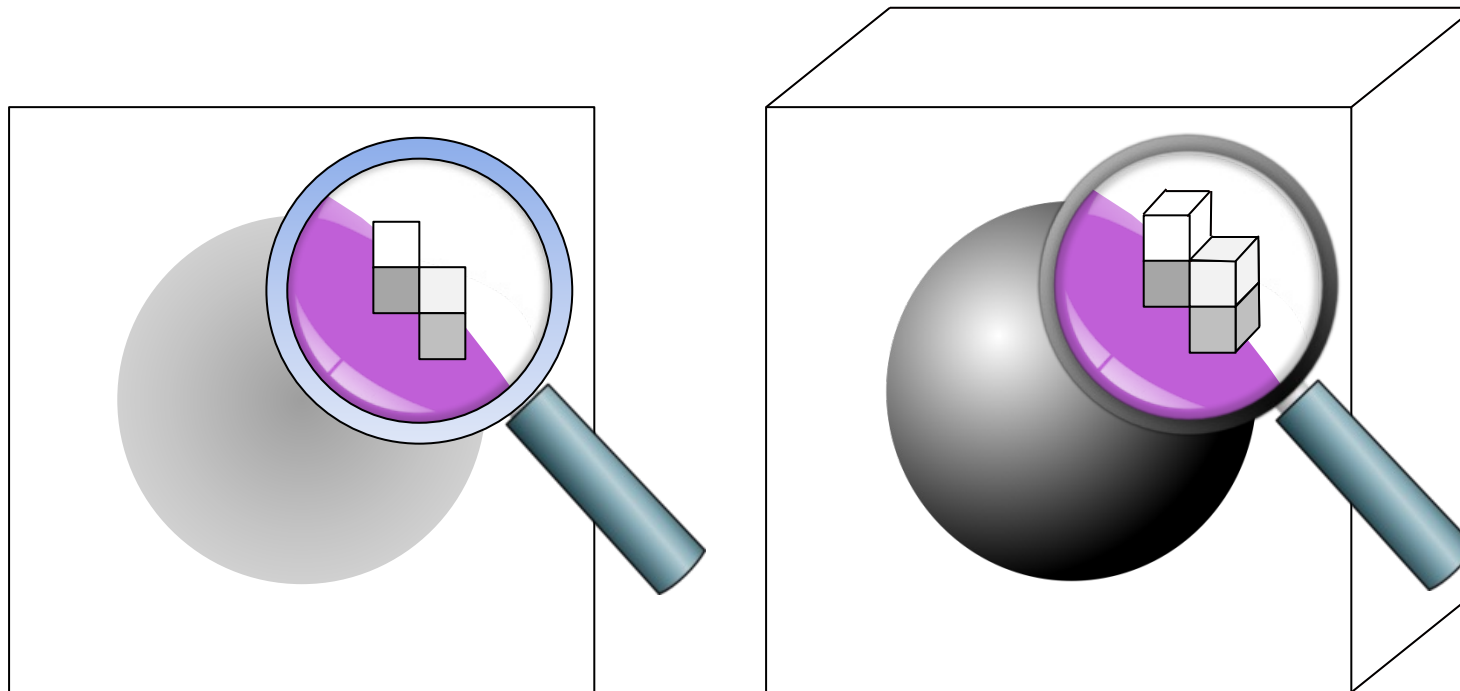
Let us use the x-rays for CT (computed tomography)

From the (many) 2D images we can construct a 3D "image"?



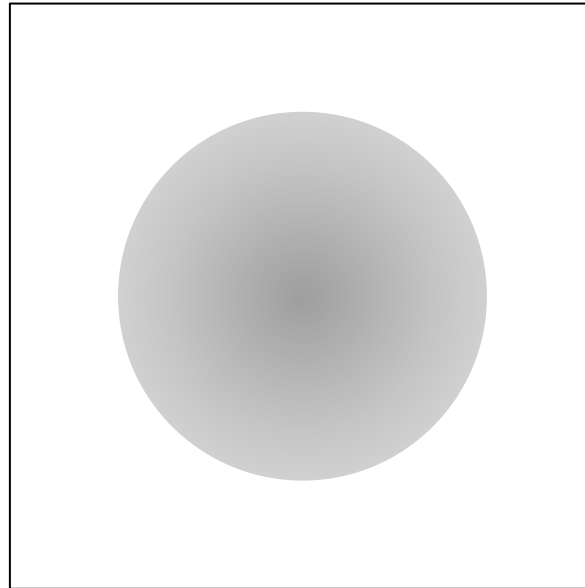
But how?

A voxel is a 3D version of a pixel

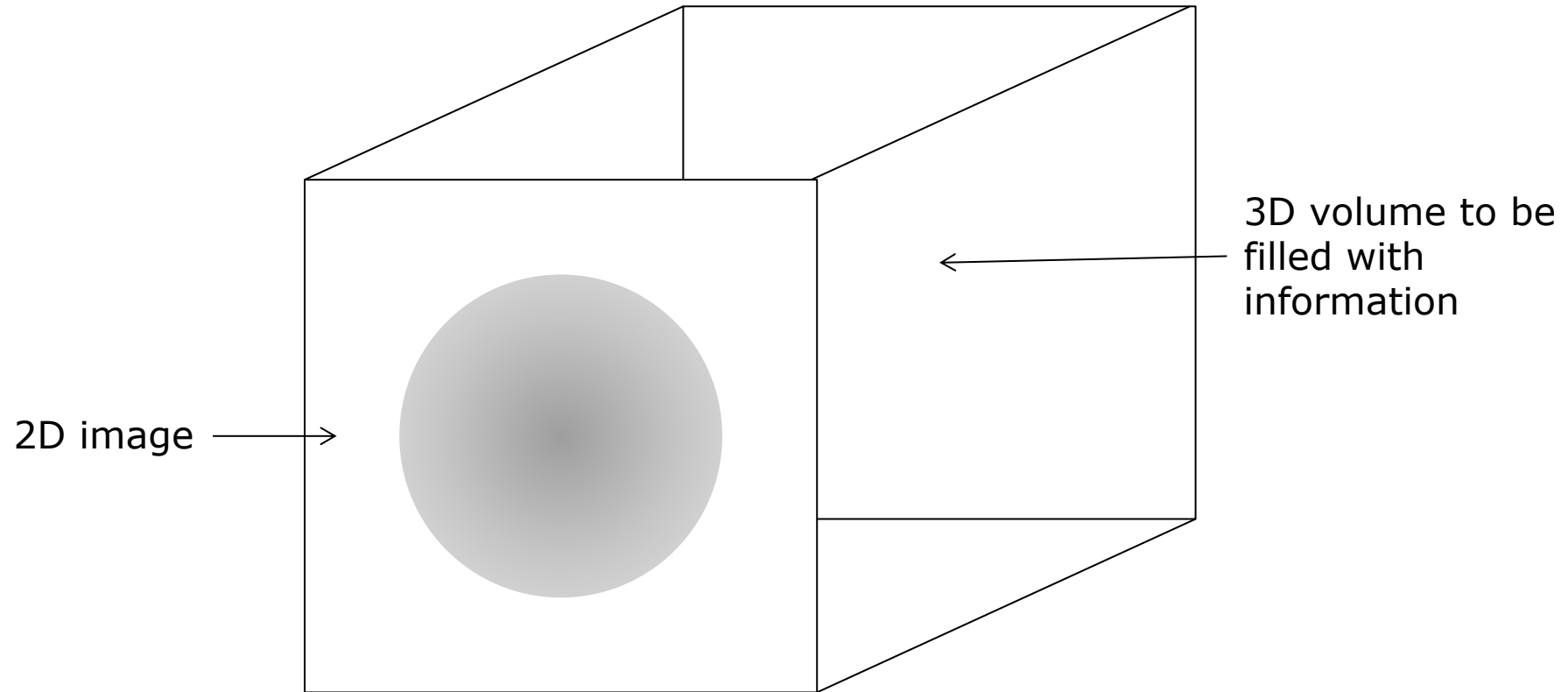


How to make the 3D reconstruction?

Example: a 2D x-ray image of a dense sphere

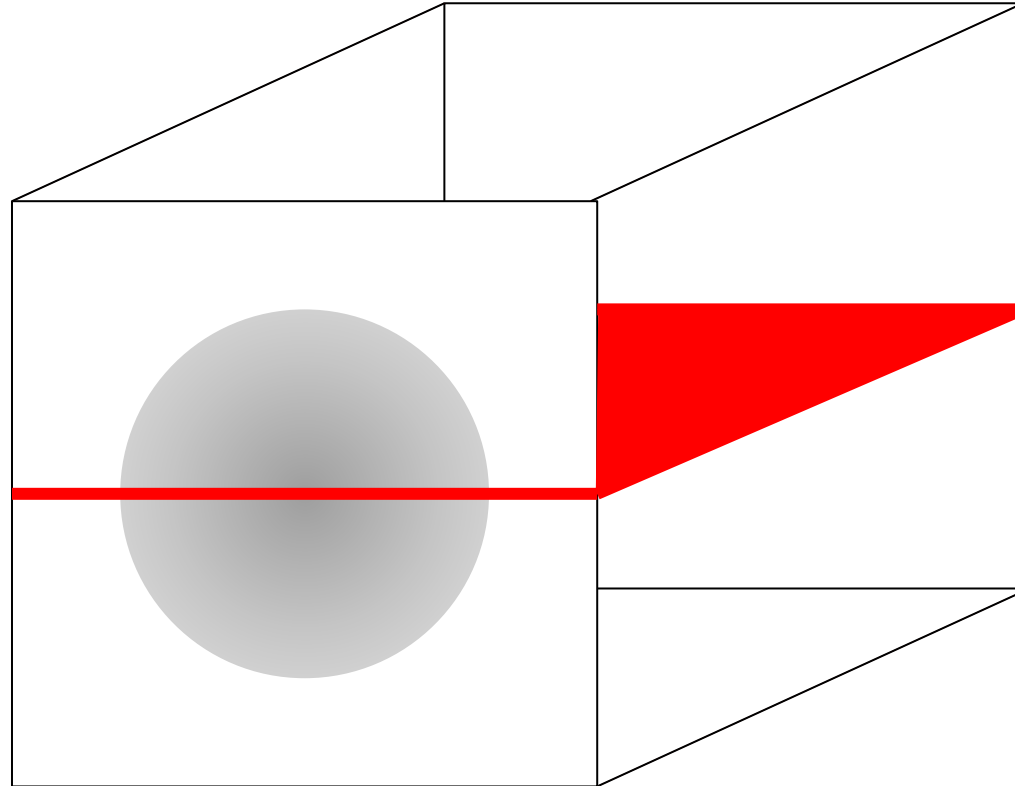


How to make the 3D reconstruction?



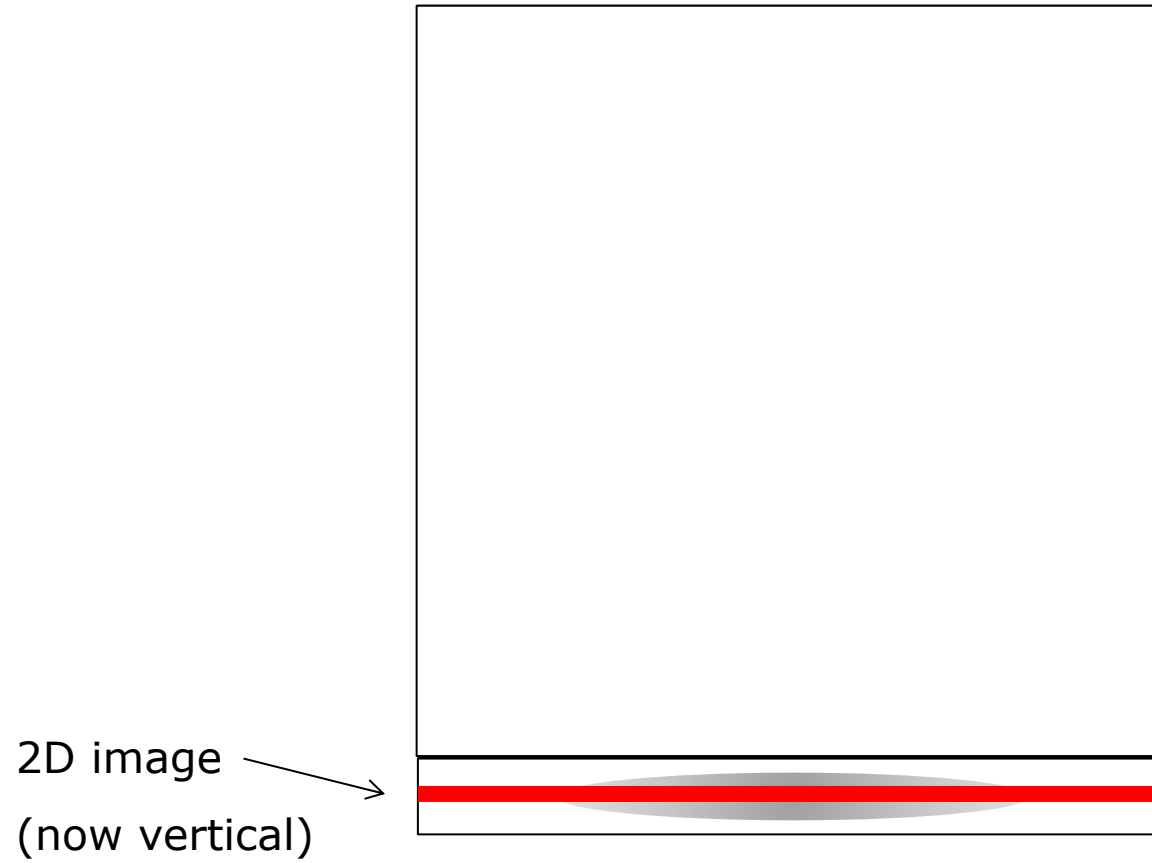
How to make the 3D reconstruction?

For simplicity, let's focus on one plane, and ...



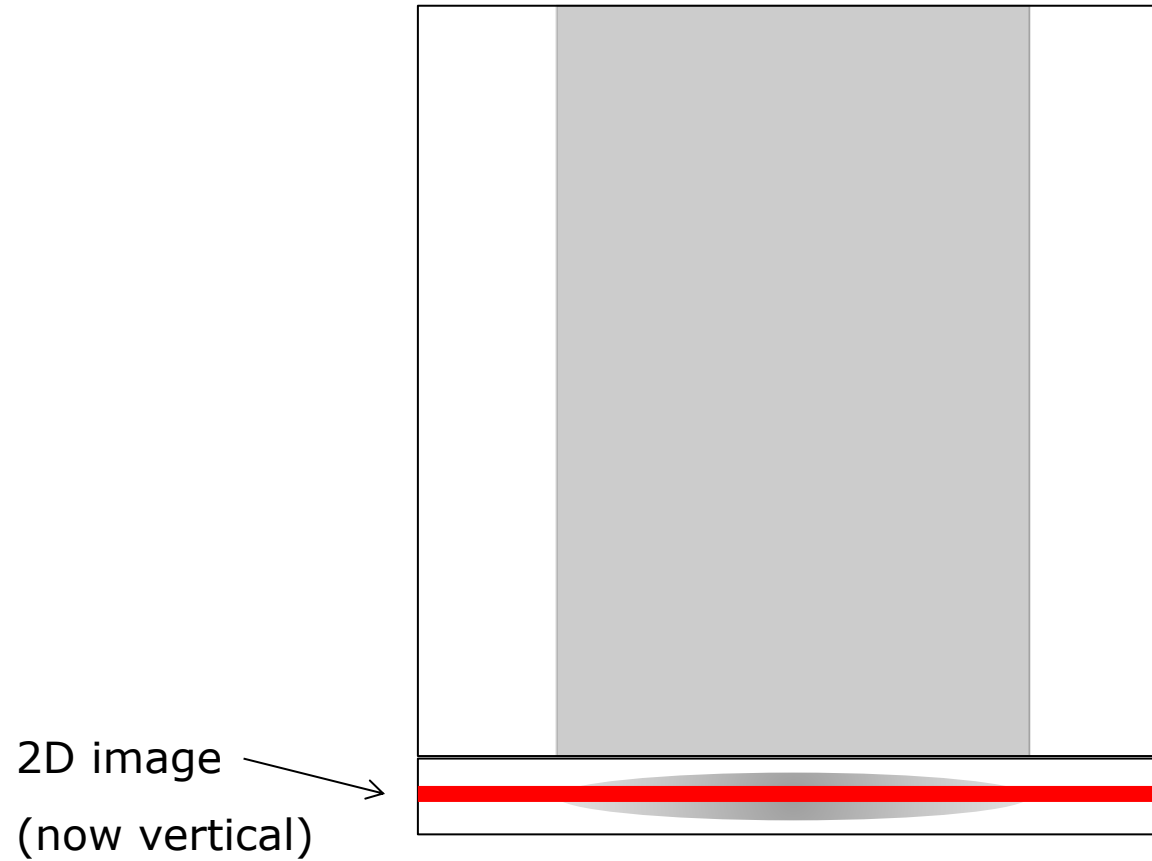
How to make the 3D reconstruction?

Imagine we look at this plane from above



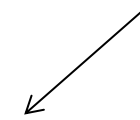
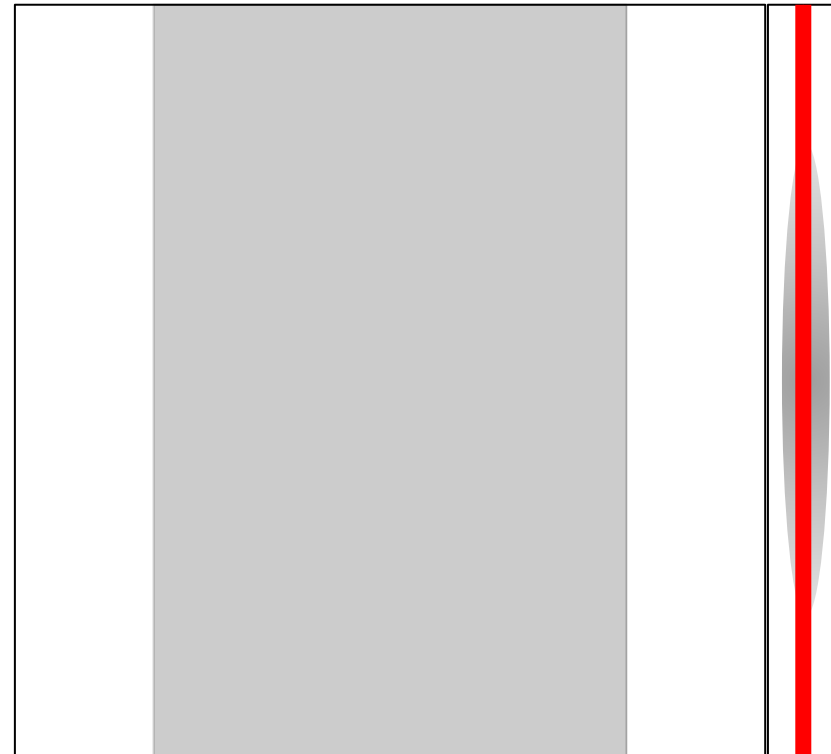
How to make the 3D reconstruction?

Backprojection: project the grey scale pixel values to all voxels in this plane at the direction normal to the 2D image



How to make the 3D reconstruction?

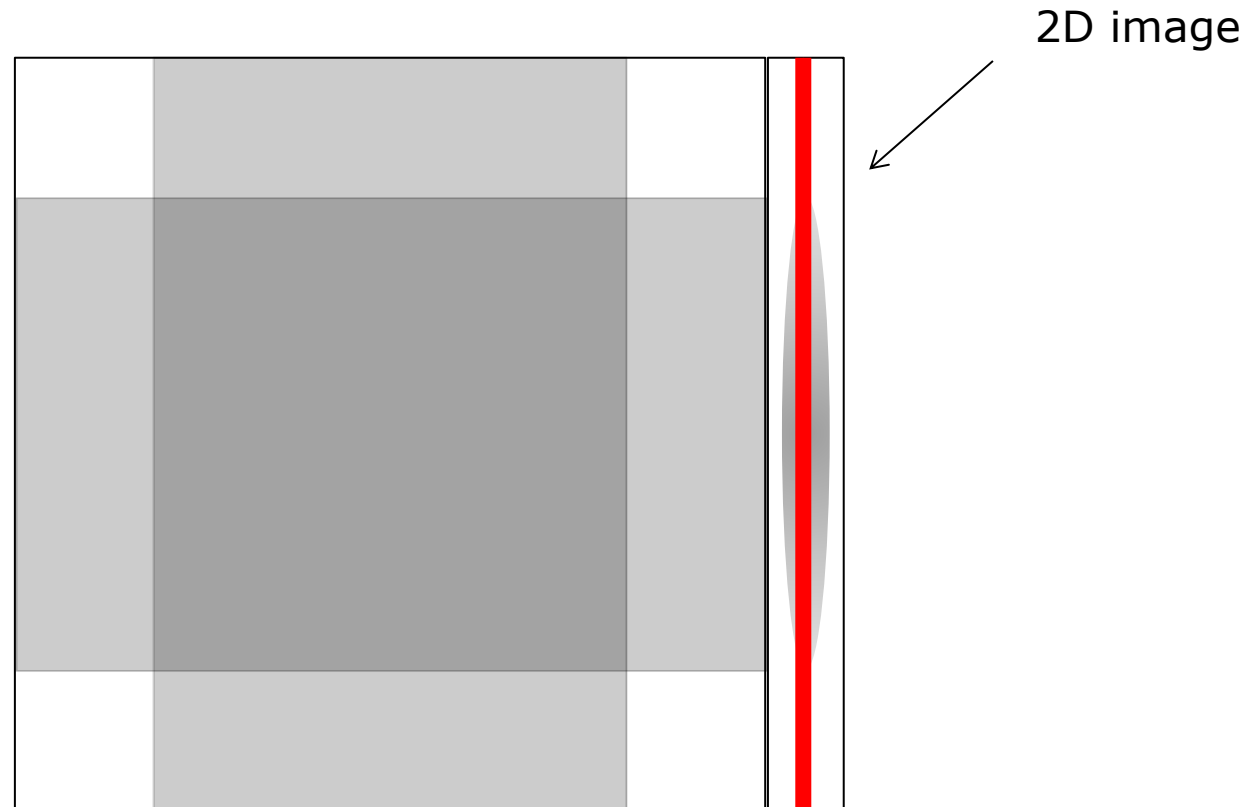
Take a different 2D image recorded from a 90 degree angle relative to the first 2D image



2D image

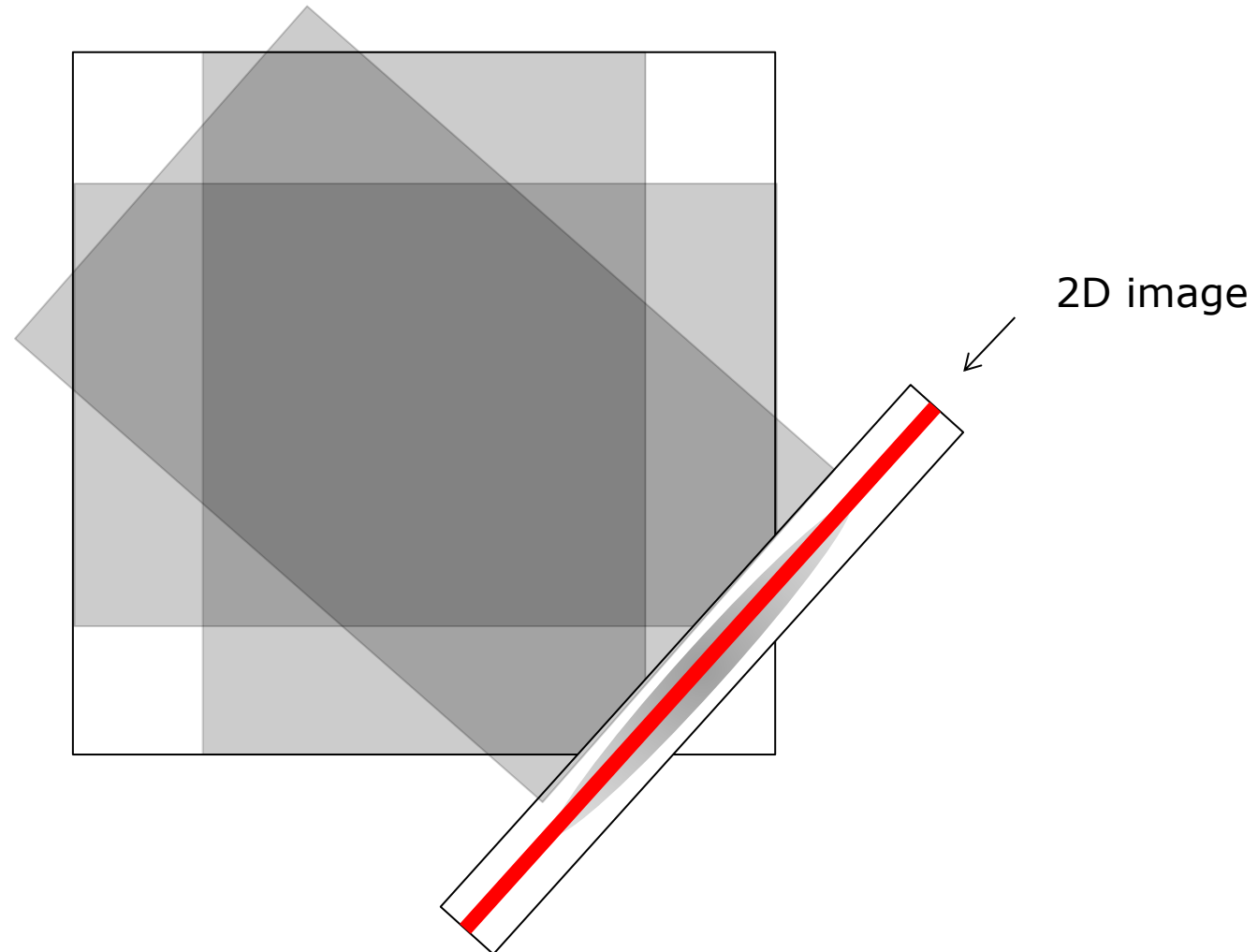
How to make the 3D reconstruction?

And backproject this



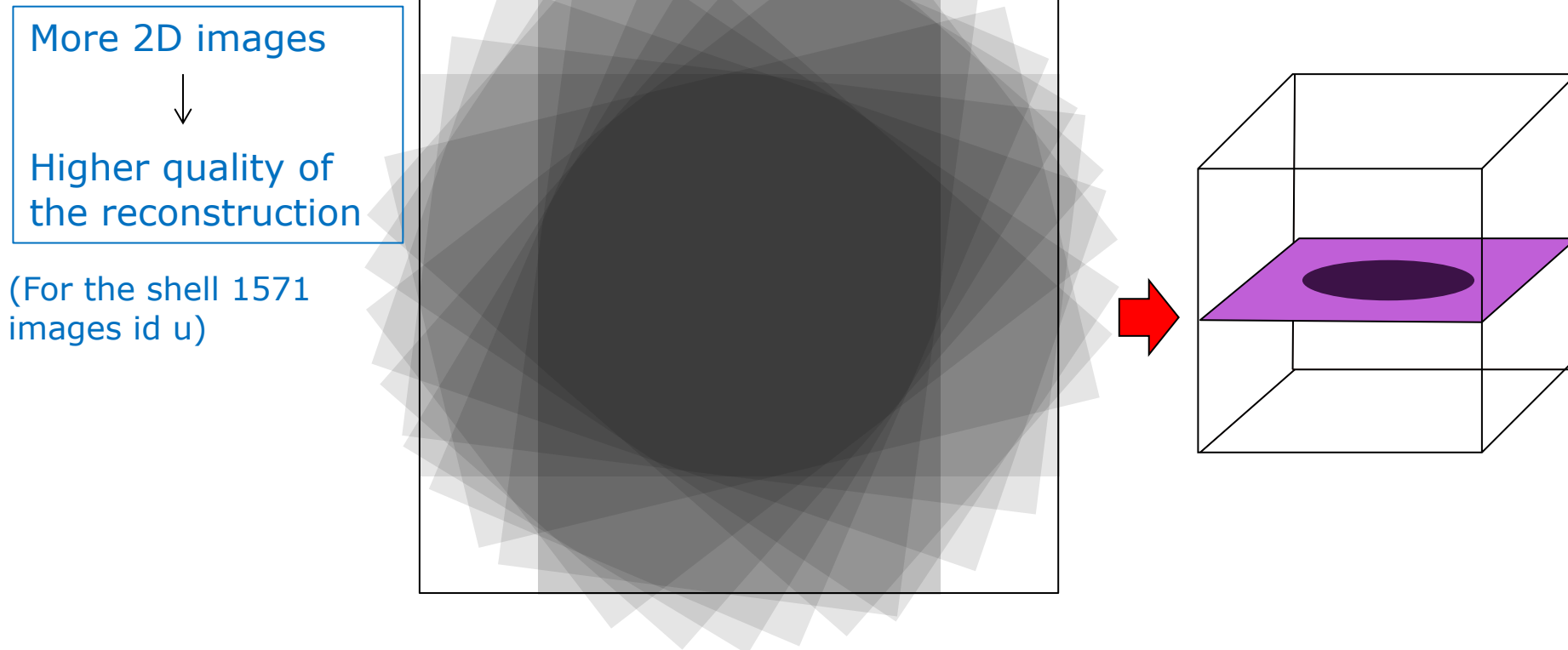
How to make the 3D reconstruction?

Add more backprojection from different angles



How to make the 3D reconstruction?

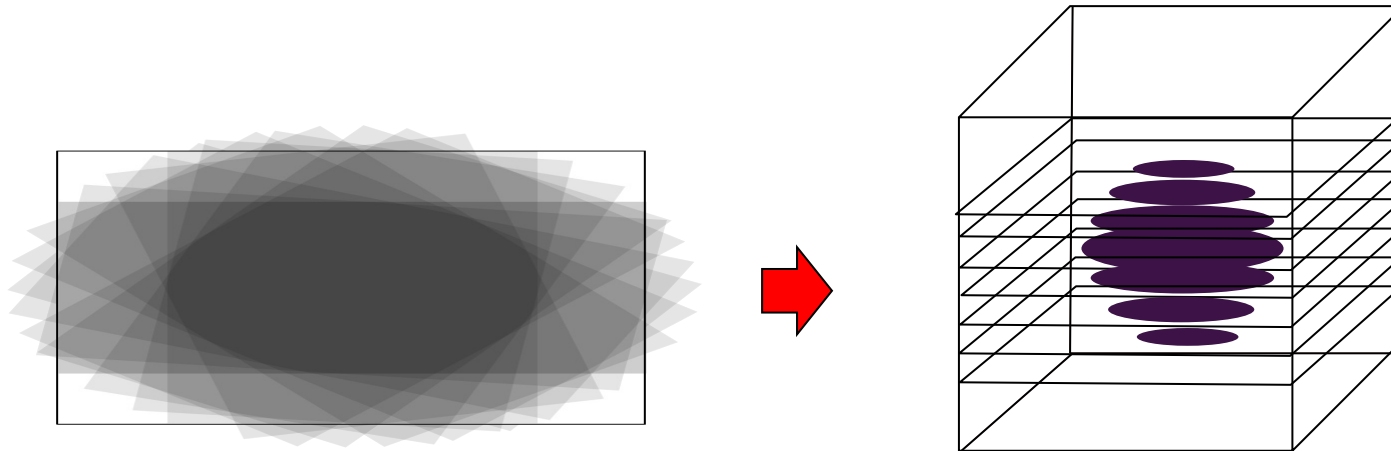
Add more backprojections from different angles

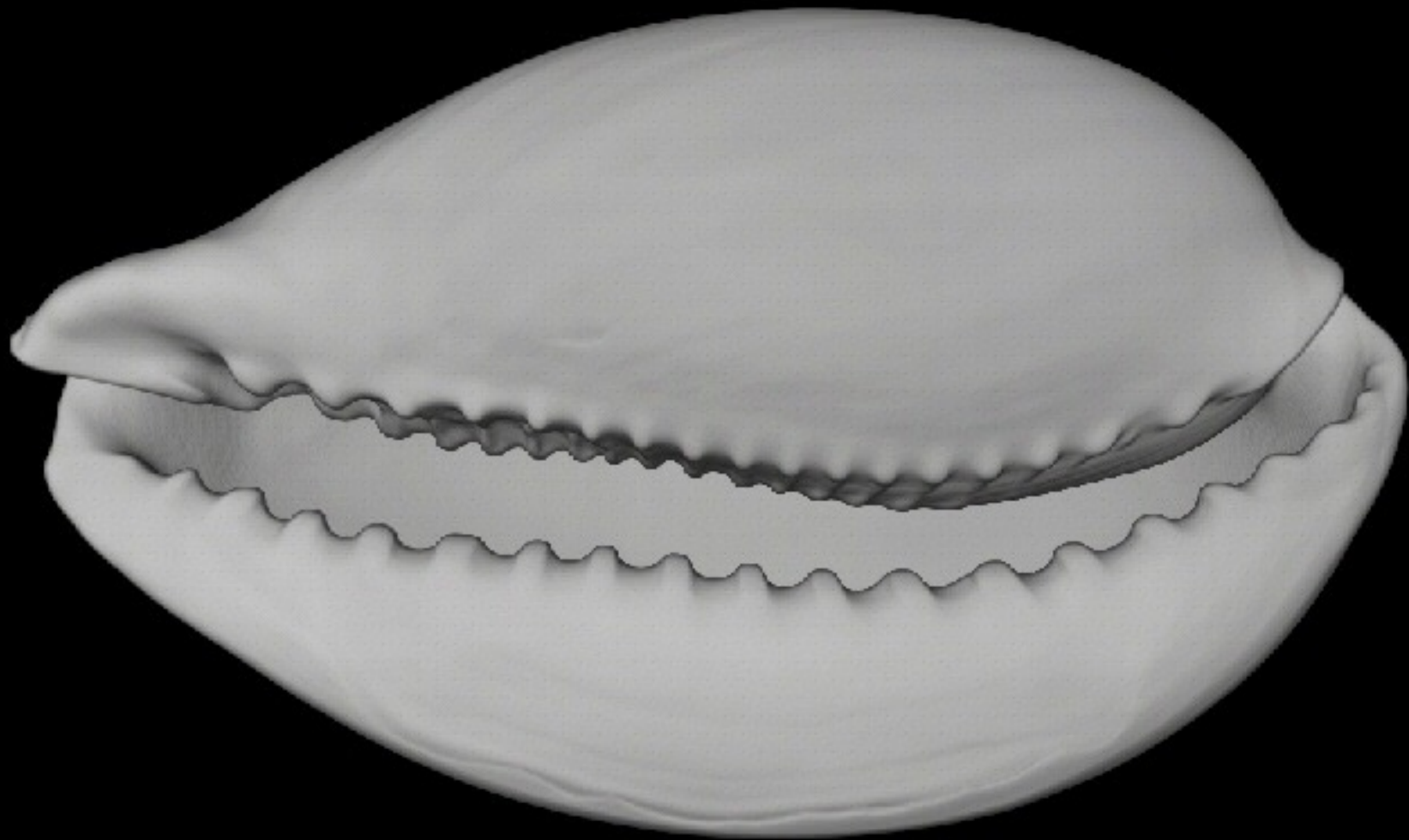


We have now reconstructed **one plane** in the 3D volume
(by using one row of pixels from ten 2D images)

How to make the 3D reconstruction?

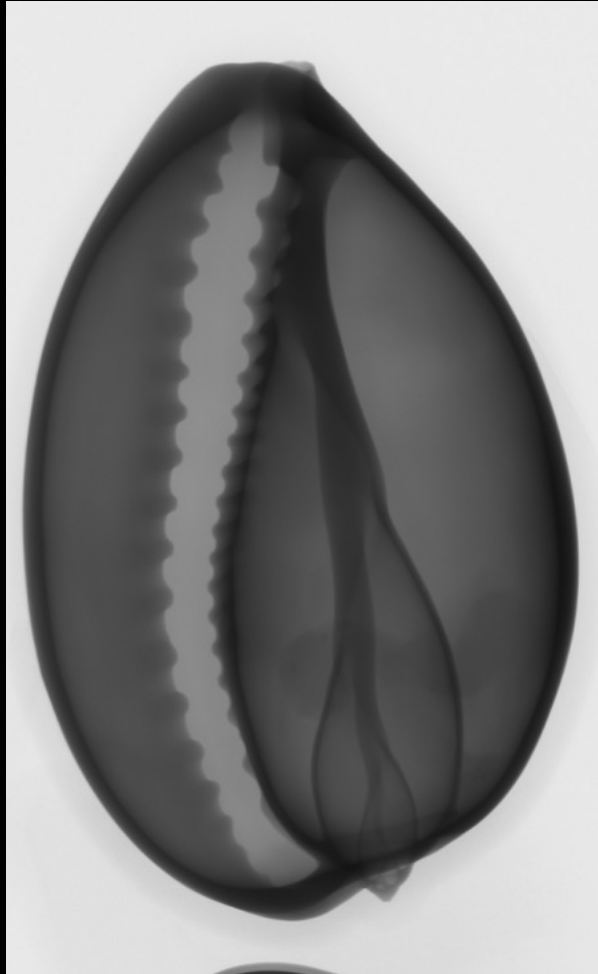
All planes in the 3D volume is reconstructed in the same way





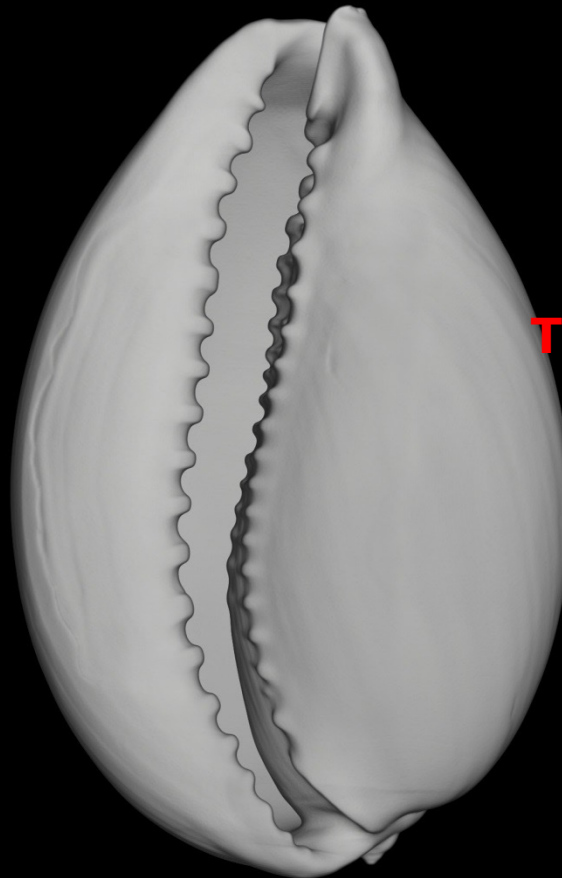
10 mm

2D x-ray image



projection

3D reconstruction



surface

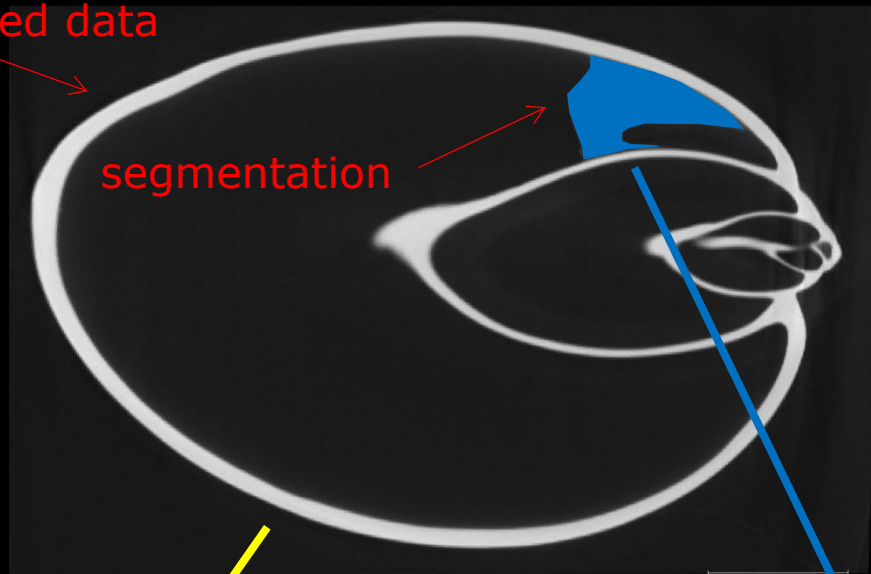
One slice in the 3D reconstruction

There is something inside!



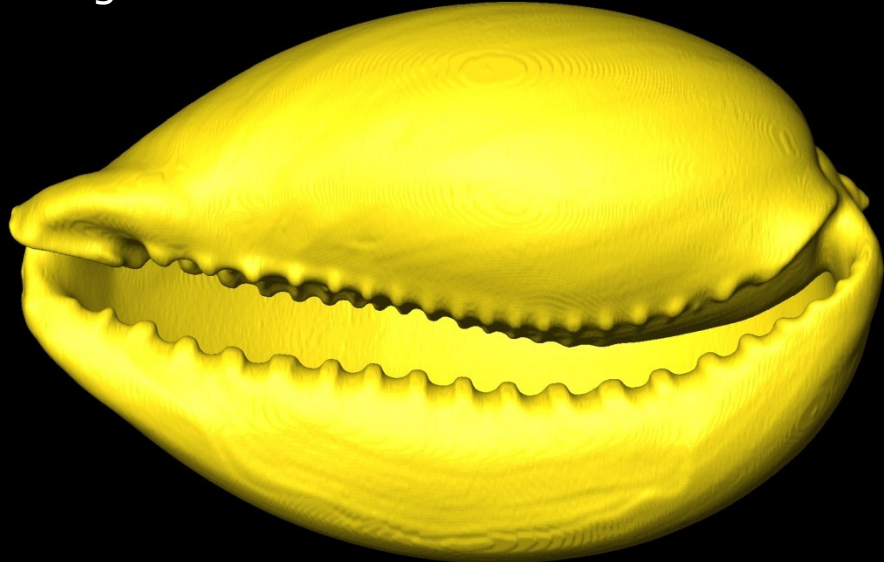
slice

reconstructed data

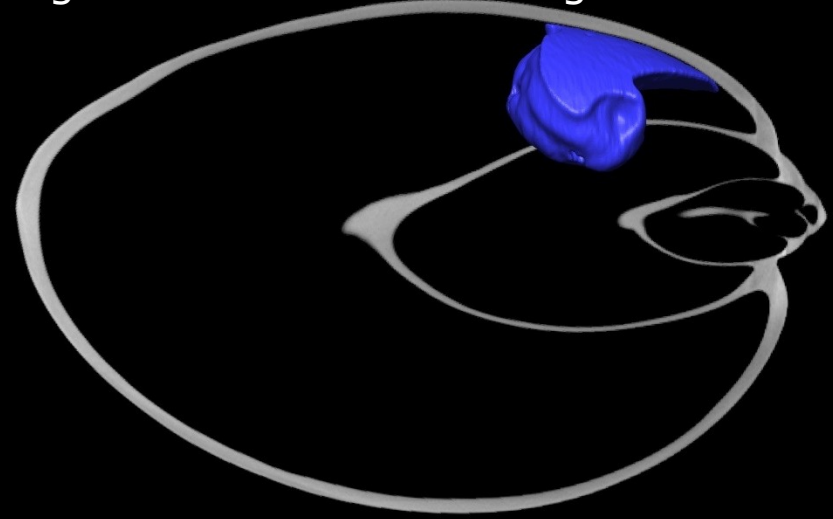


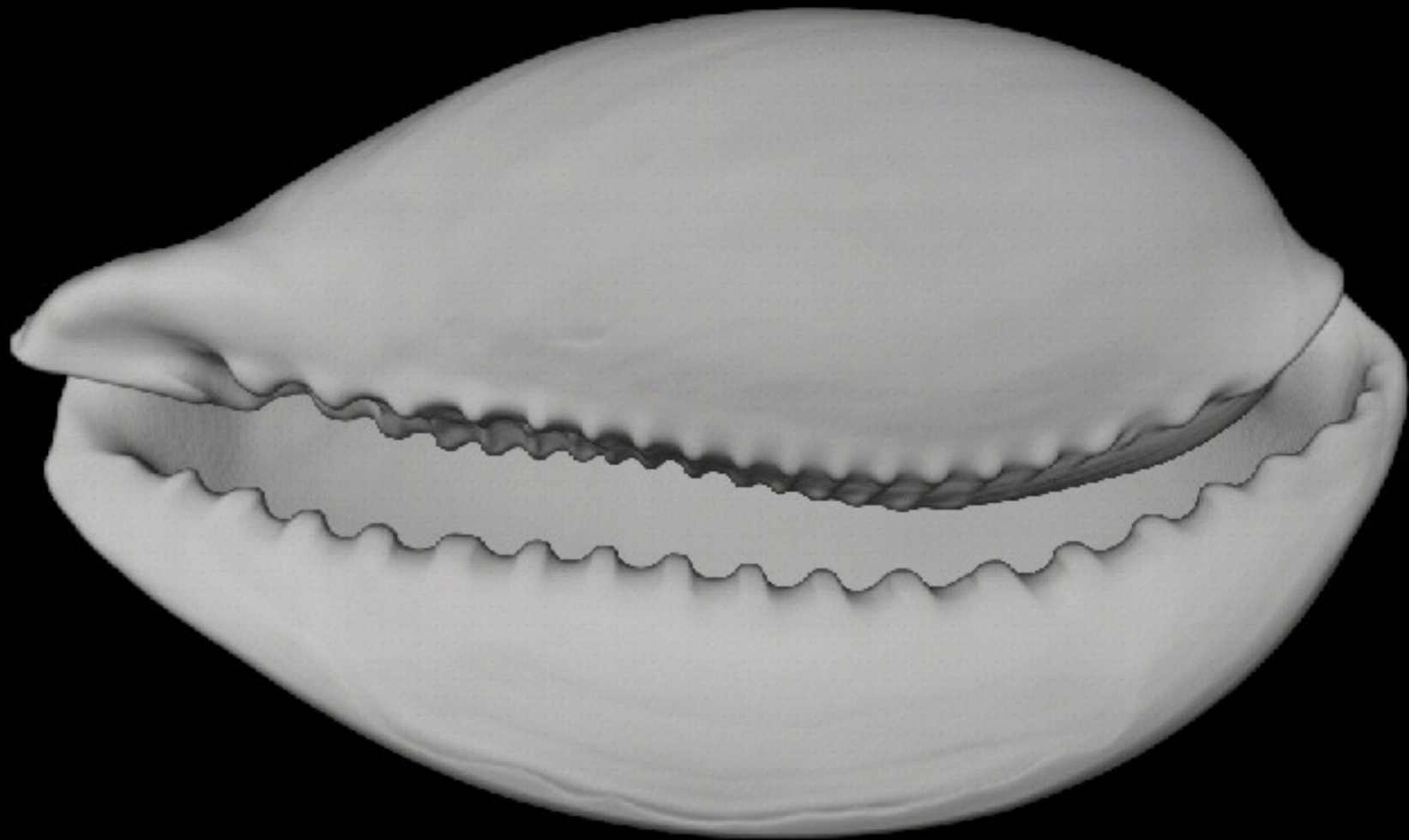
Segmentation =
Identify which voxel
values that belong to
which material

Segmentation of the shell



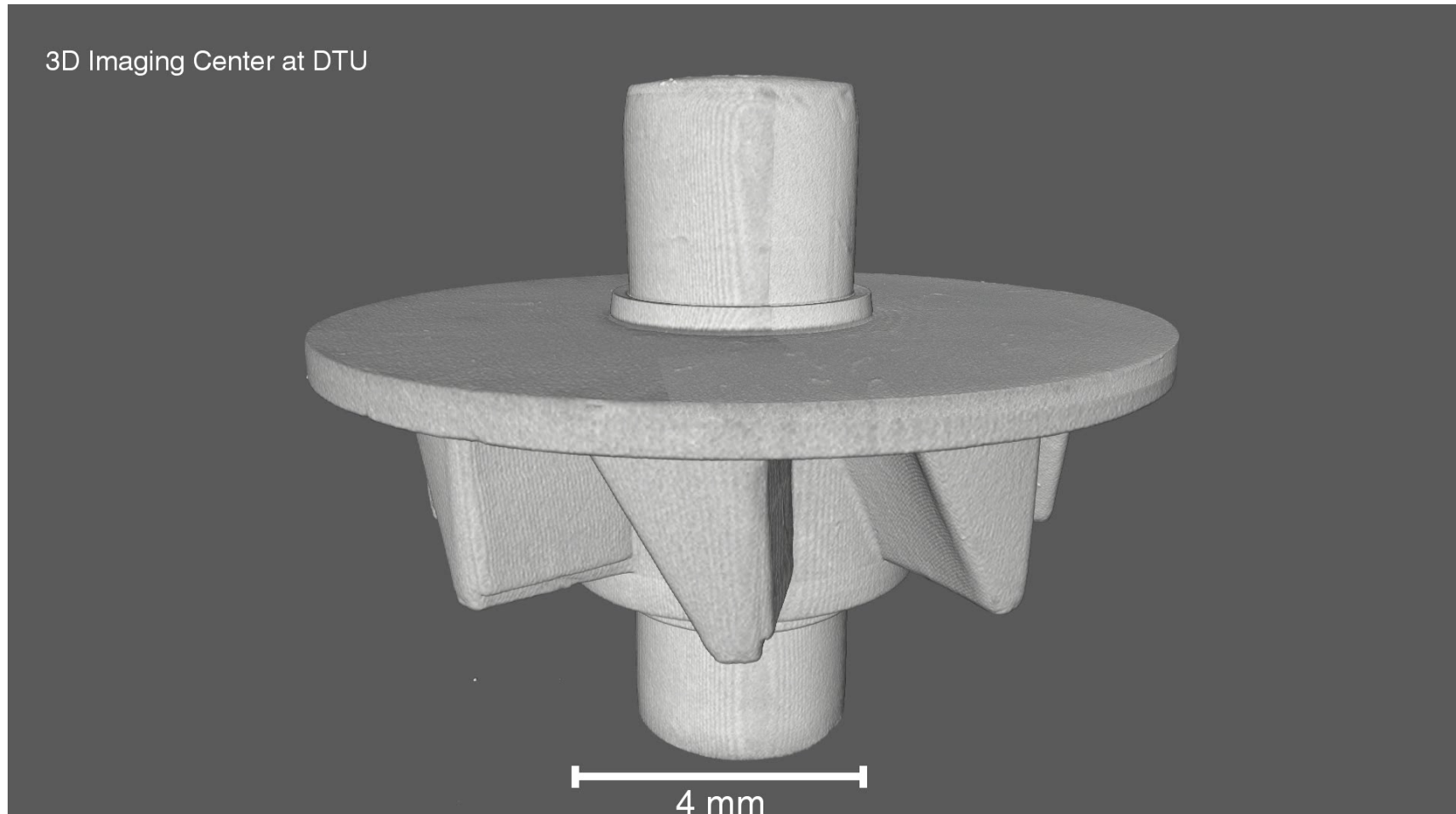
Segmentation of something inside



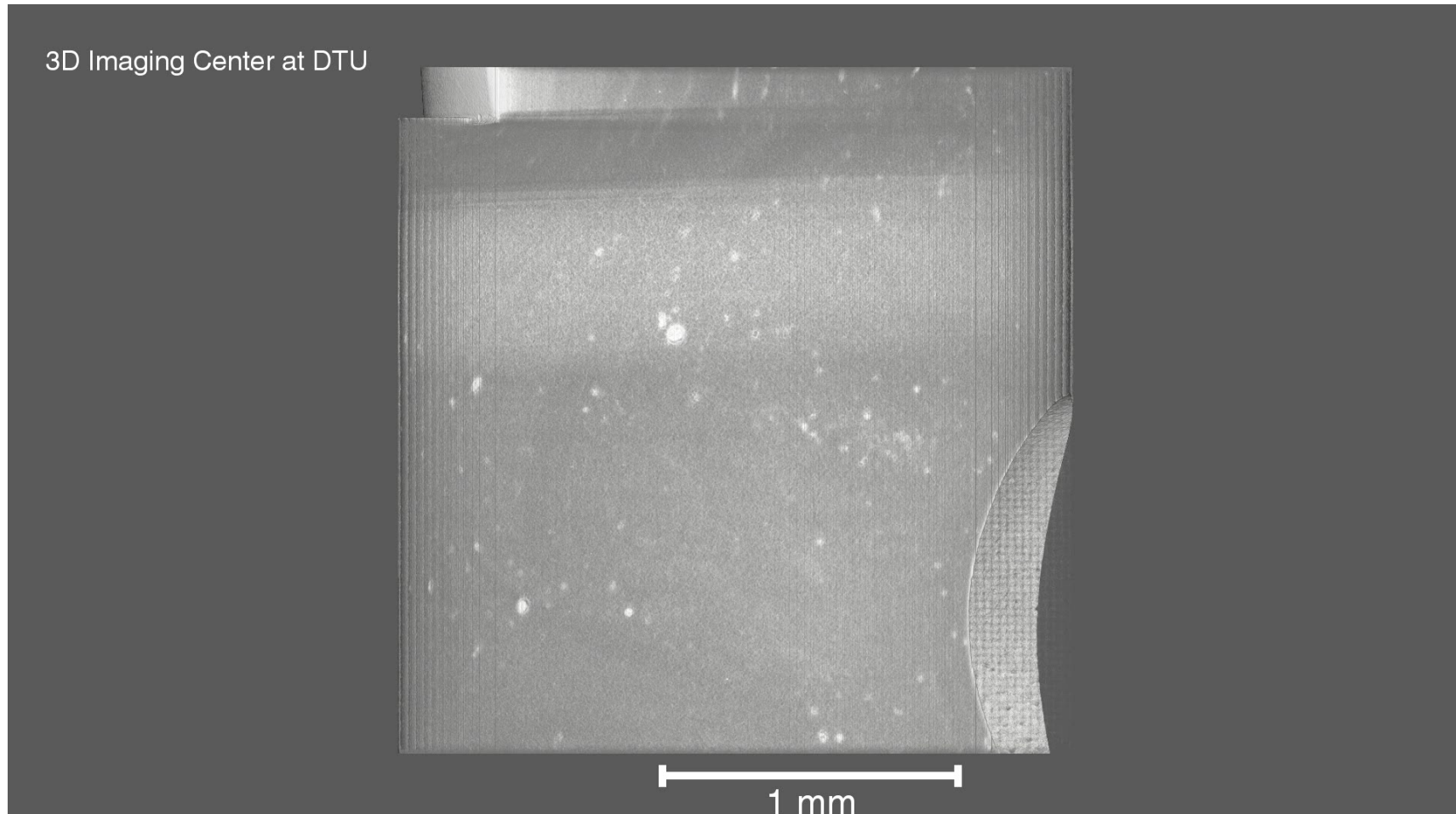


10 mm

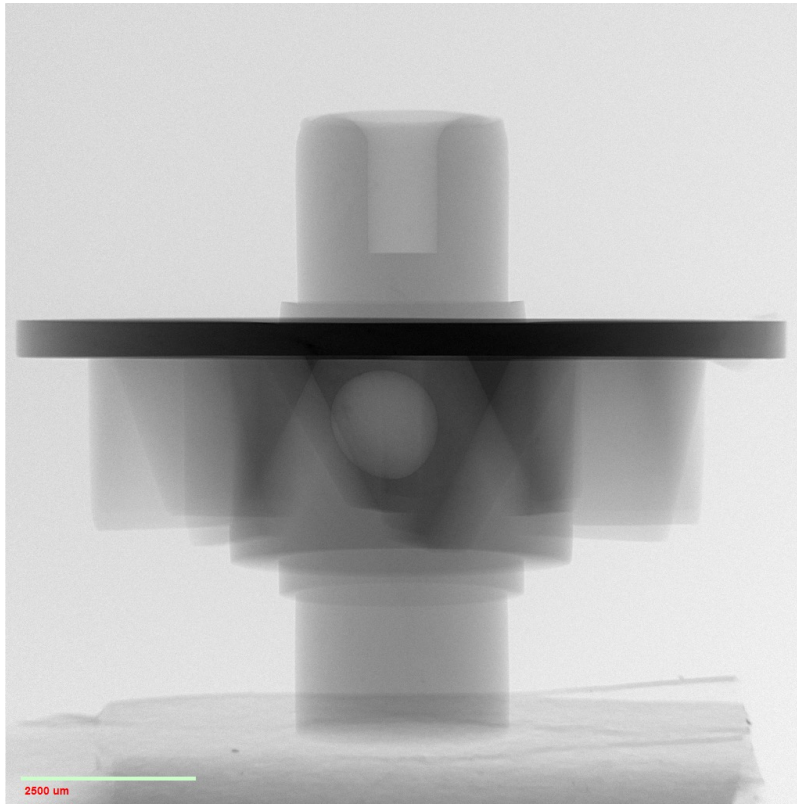
Micro component injection moulding



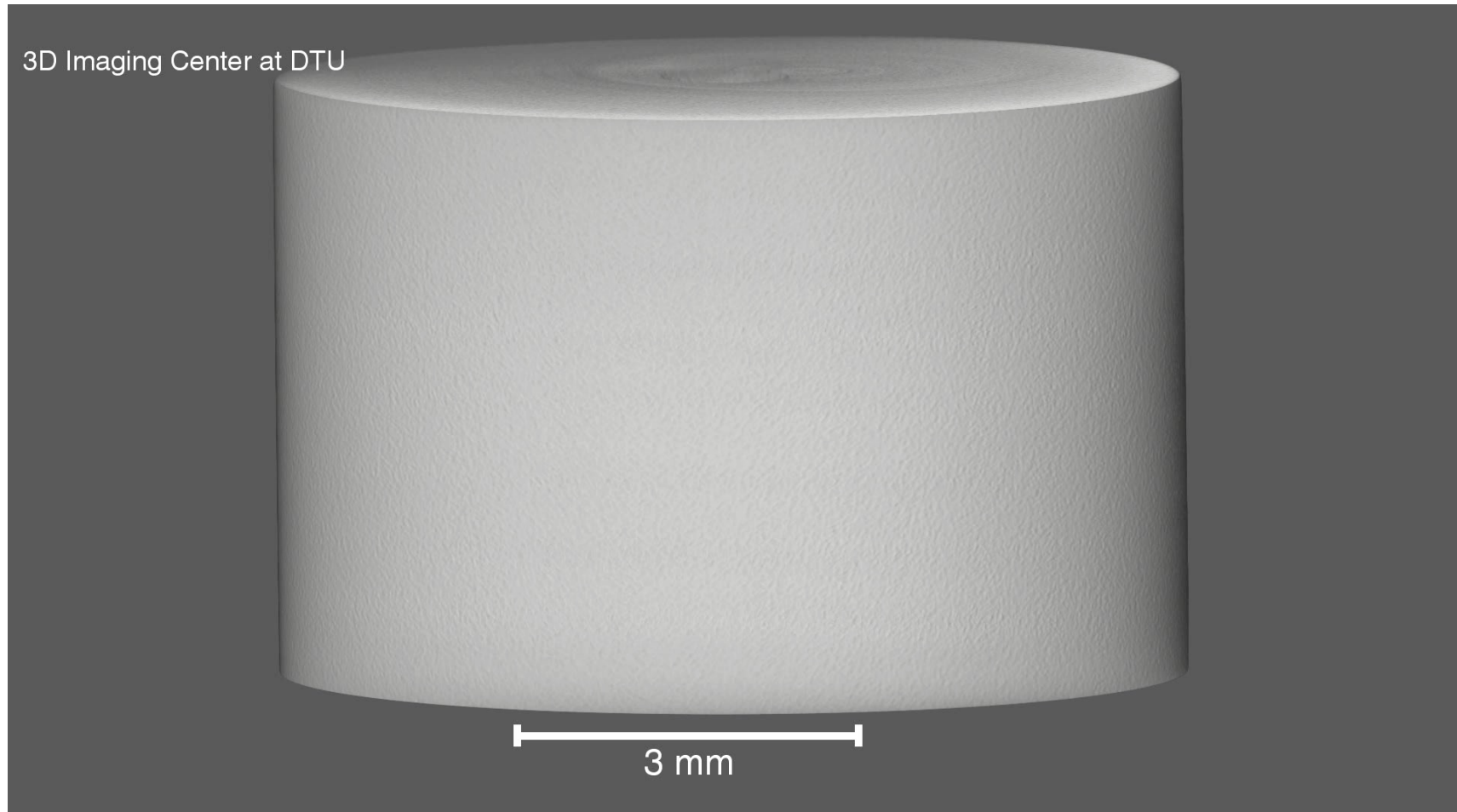
Micro component injection moulding



Magic of X-ray tomography



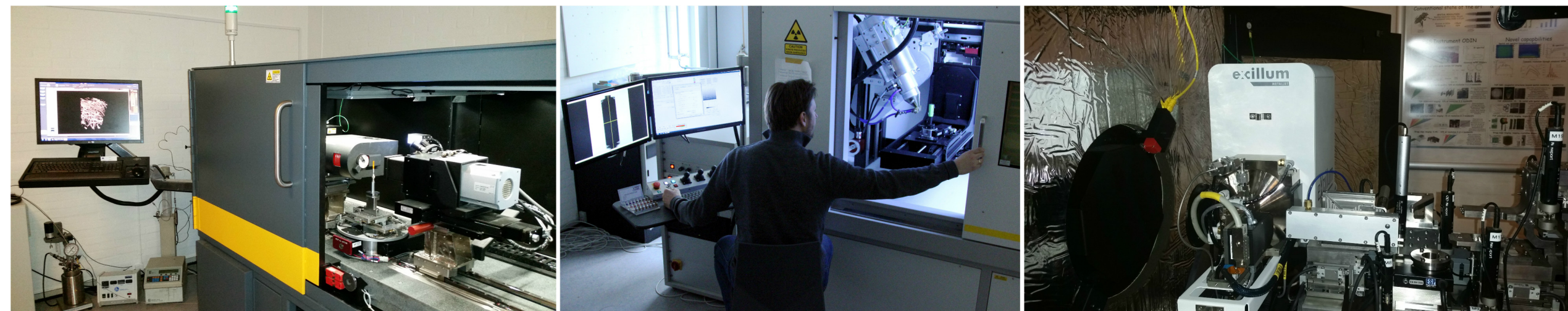
Micro component of Wolfram



We are not done with this lecture, but let's take a break



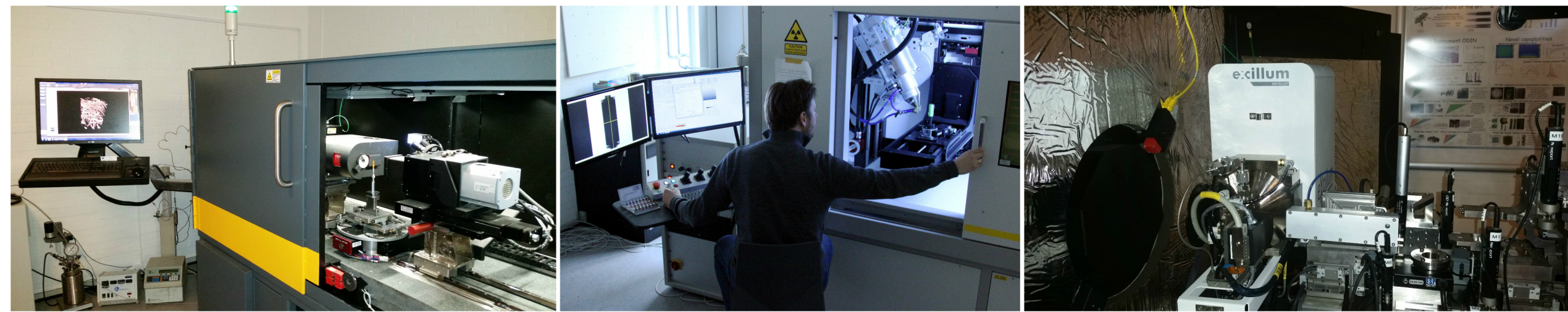
3D imaging Center at DTU



The 3D Imaging Center is a collaborations between different departments with different strengths.

- DTU Physics – Development within X-ray methods and focus on hard materials
- DTU COMPUTE – Development of tomography reconstructions and image segmentation
- DTU Energy – X-ray science and energy materials
- DTU Mechanical Engineering – Mechanical properties of materials and metrology
- DTU Wind Energy – Extensive use of X-ray imaging for materials

3D imaging Center at DTU



- A national infrastructure for x-ray imaging: DANFIX
- A regional facility for data analyses: QIM
- An ESS lighthouse: SOLID
- An industry portal
- A science hub for materials and bioimaging



QIM: The Center for Quantification of Imaging Data DTU, KU, LU, MAX IV & The 3D Imaging Centre

Imaging

Structural quantification is the most time-consuming part of imaging

Users are often not analysis experts

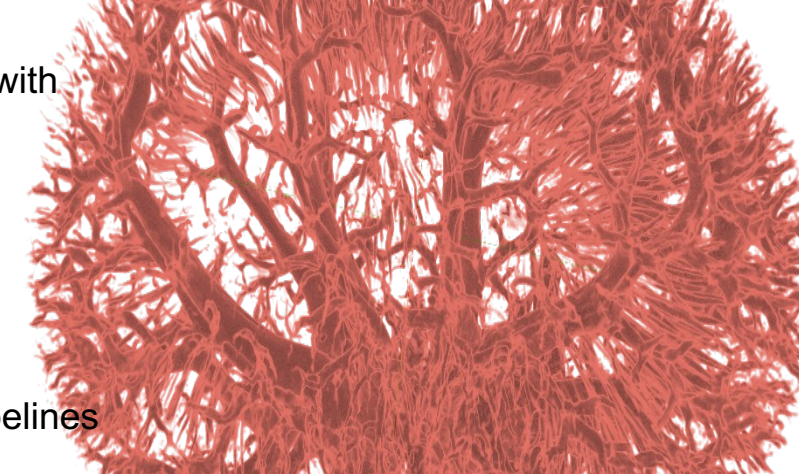
- difficulty in handling data
- difficulty in finding method that match problem

Can lead to that data is not utilized to its full potential!

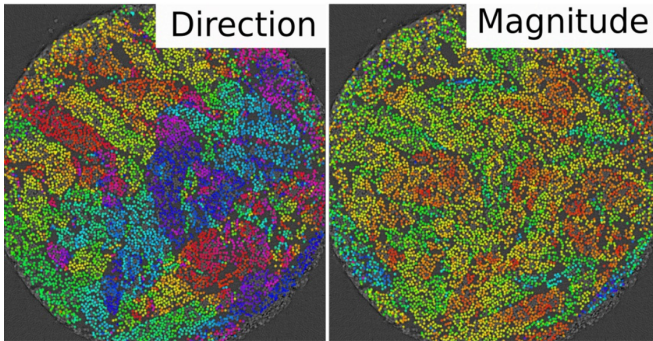
Purpose

Support users at MAX IV & lab facilities with image analysis

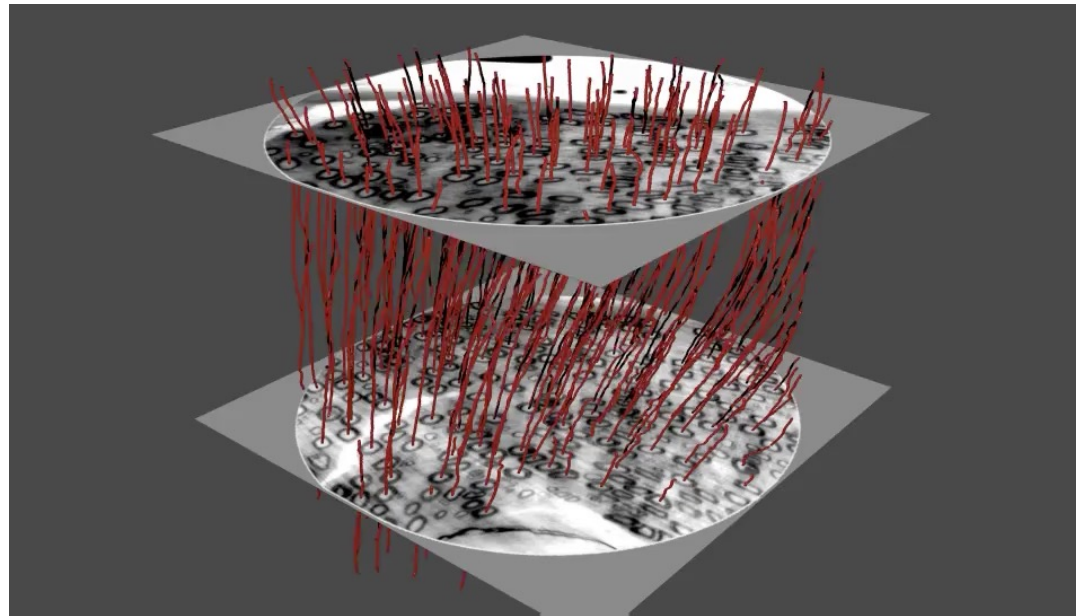
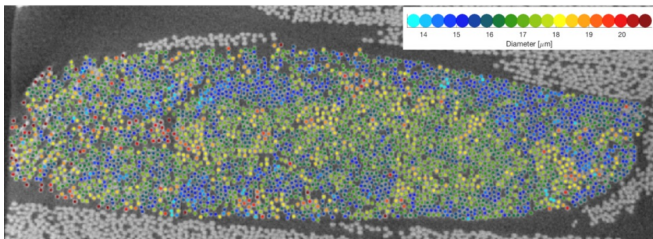
- Case-specific collaboration
- Competence development
- Development of tools and analysis pipelines



Fibre misalignment



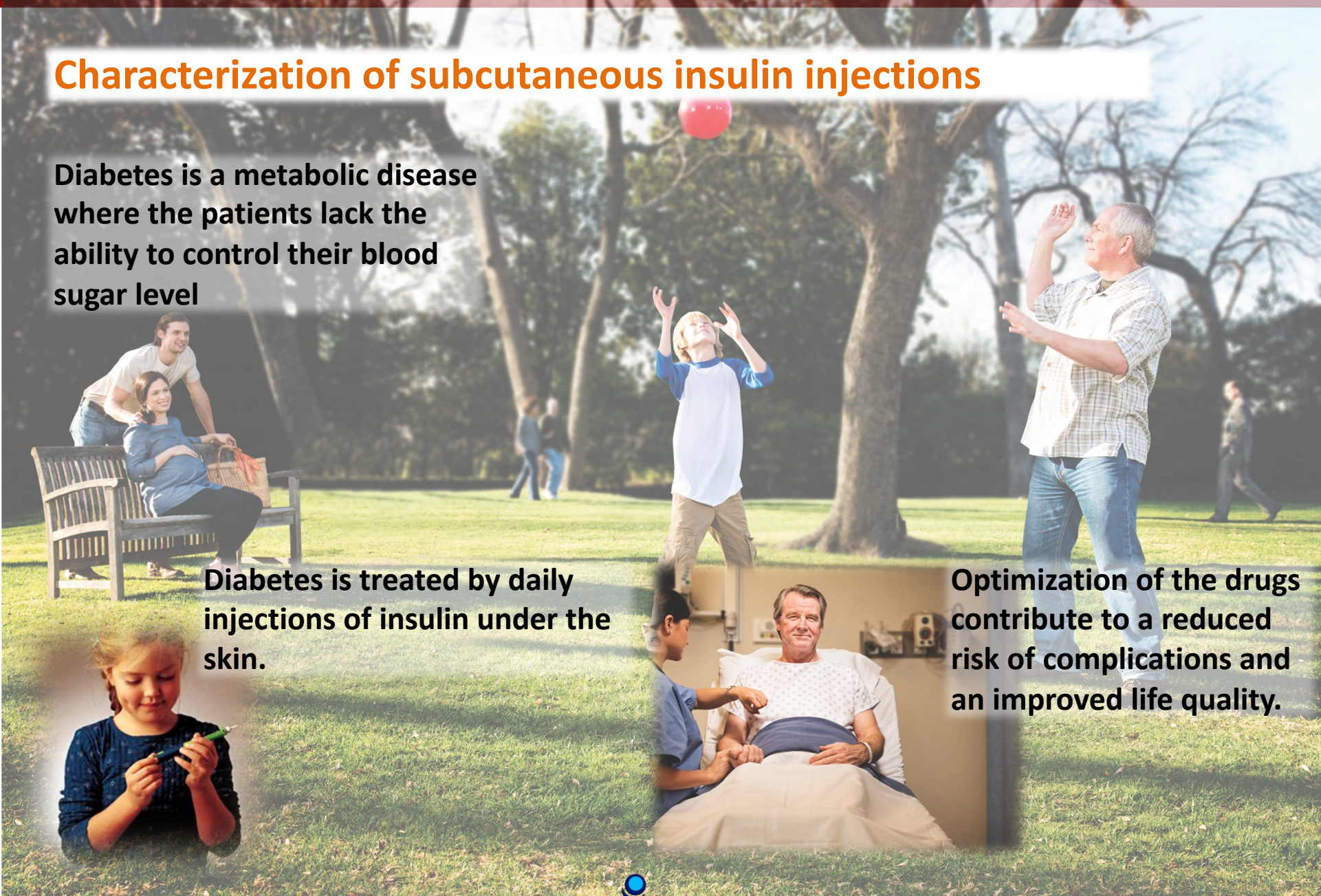
Fibre diameters



	Dense Ishikawa	4N-SLG	RC-SLG
Few 2D objects	27 s	15 s	0.1 s
Many 2D objects	Not feasible	191 s	1 s
Many 3D objects	Not feasible	Not feasible	44 min

Characterization of subcutaneous insulin injections

Diabetes is a metabolic disease where the patients lack the ability to control their blood sugar level



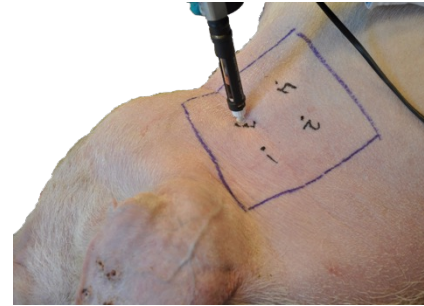
Diabetes is treated by daily injections of insulin under the skin.

Optimization of the drugs contribute to a reduced risk of complications and an improved life quality.

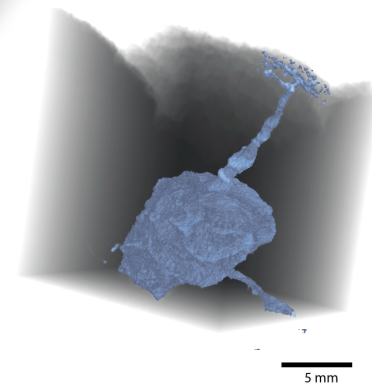
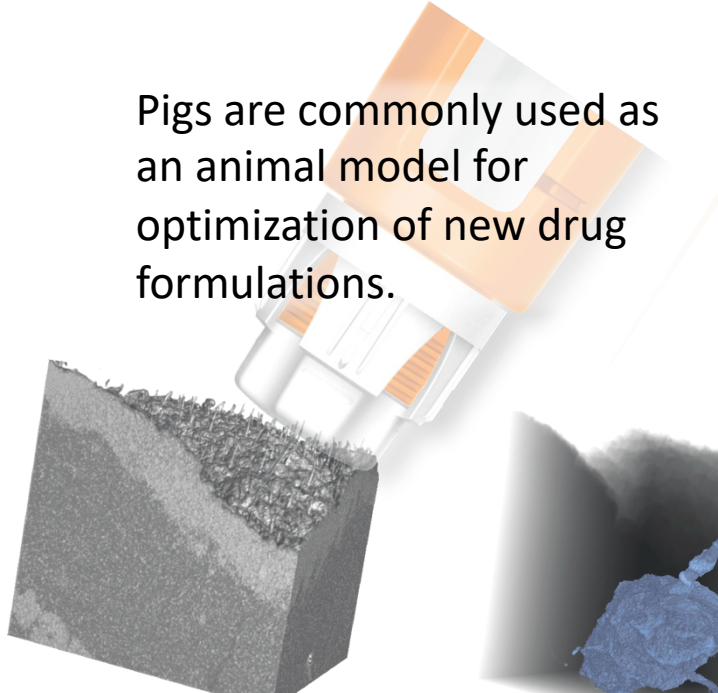


Characterization of subcutaneous insulin injections

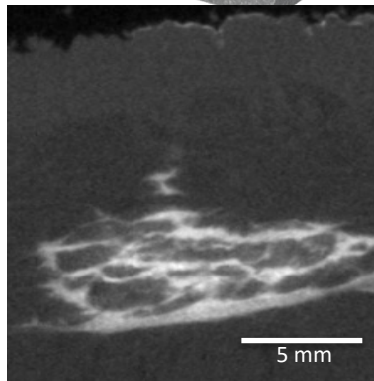
Pigs are commonly used as an animal model for optimization of new drug formulations.



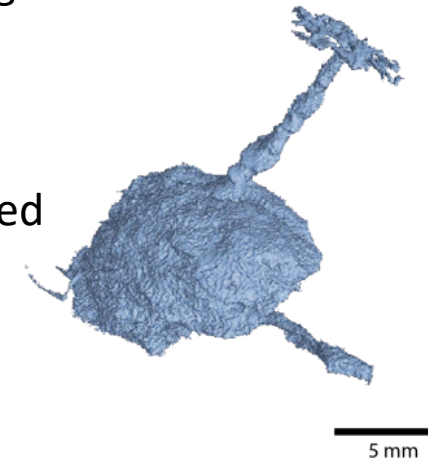
- LFOV
- 40 kV
- 5 sec
- LE2
- 401 projections



Insulin drugs mixed with an iodine based contrast agent has been injected under the skin of research pigs.

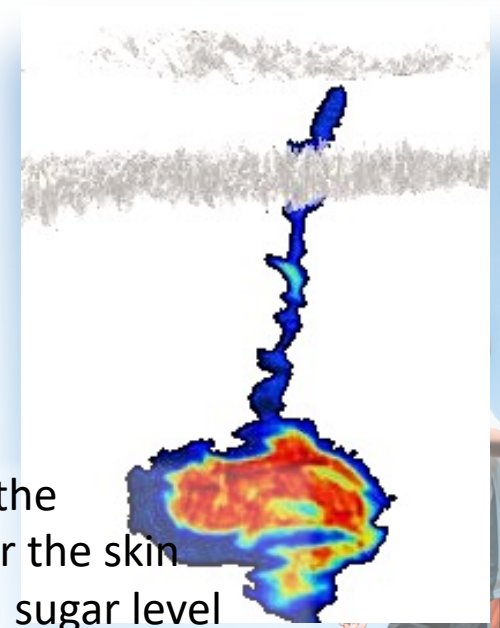
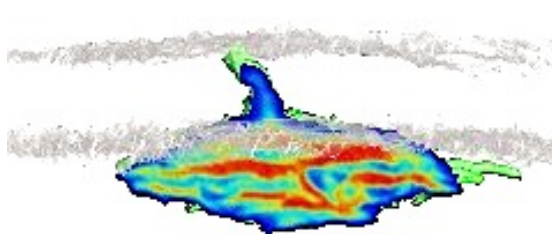
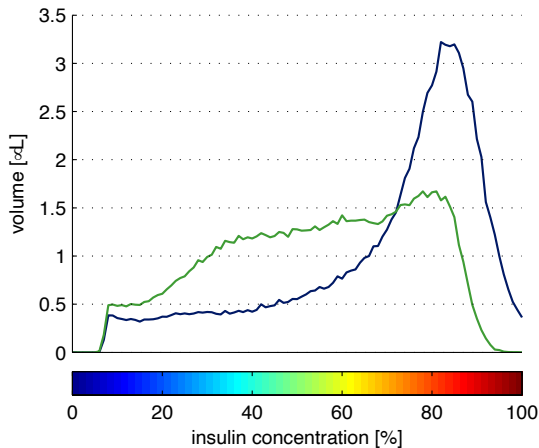


The drug distribution has been visualized with high spatial resolution using the Xradia Versa VRM-410 at DTU.



Injection depth and drug dissolution

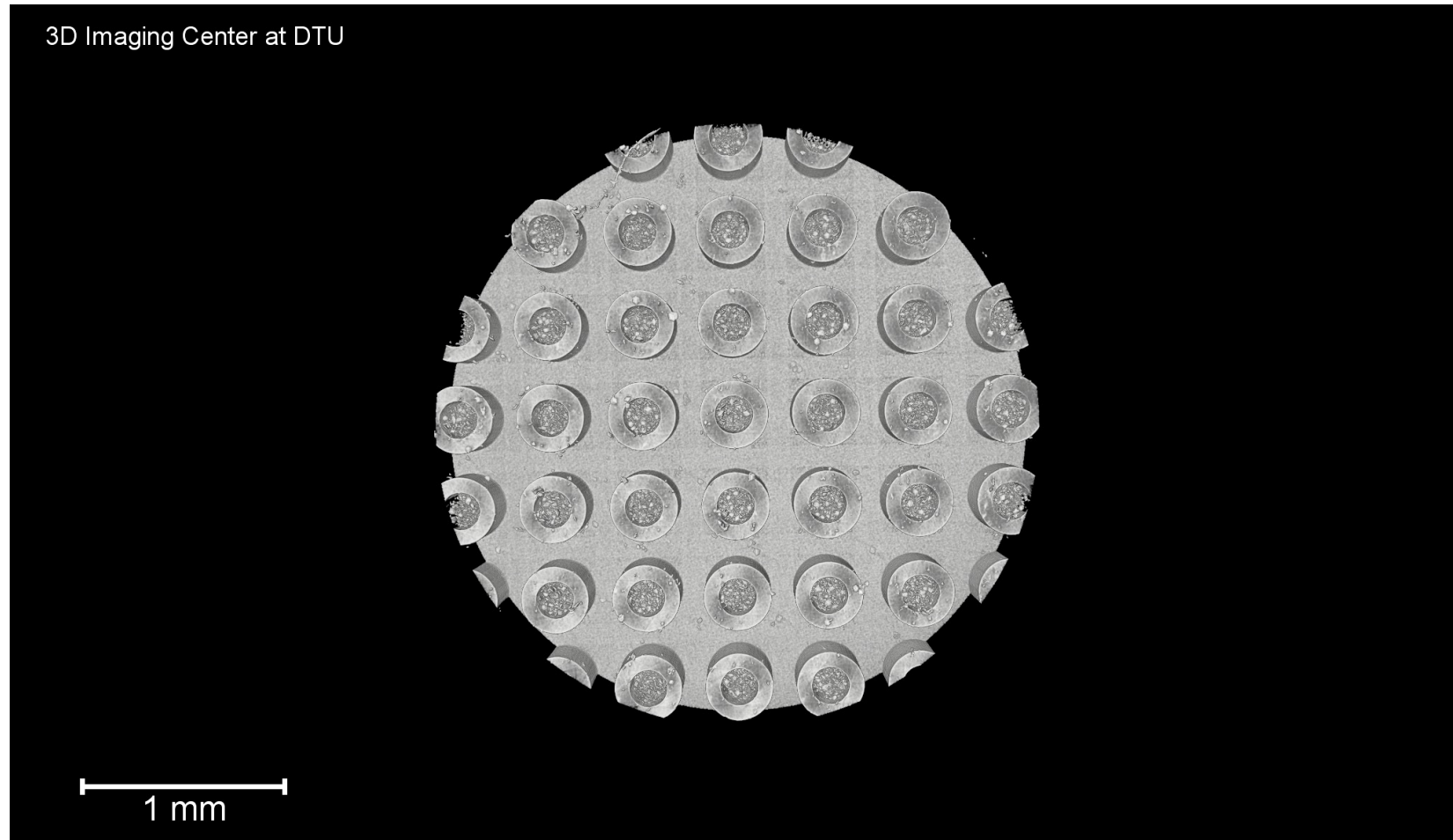
The different skin layers can be separated and the dissolution of insulin can be evaluated for the CT-scan.



The position of the drug and the concentration of insulin under the skin influences how fast the blood sugar level decreases after the drug has been injected.

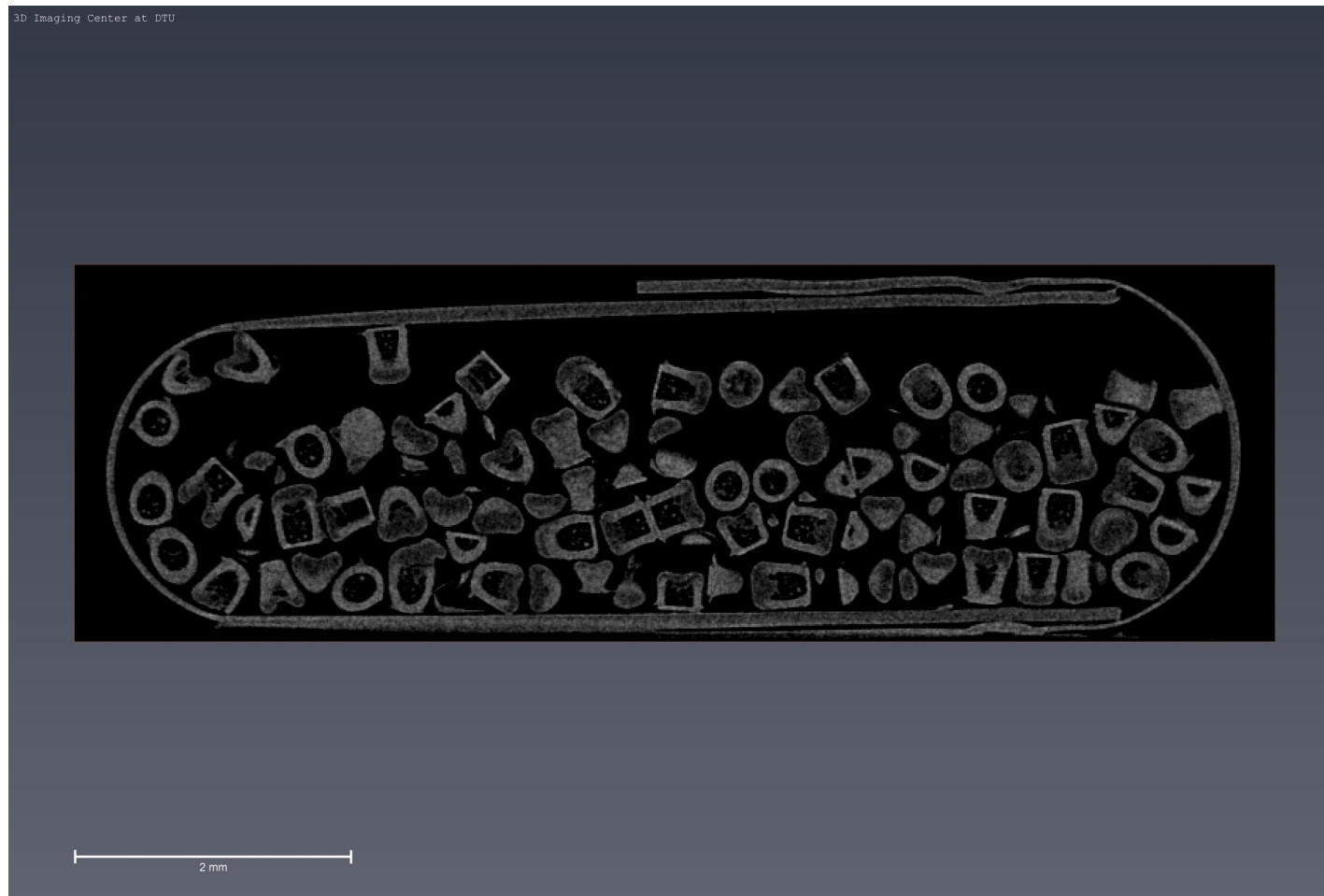
Visualization of the injection process is an important step on the way to understanding the drug device interaction and to potentially improve both drugs and devices in the future.

Micro containers for drug delivery



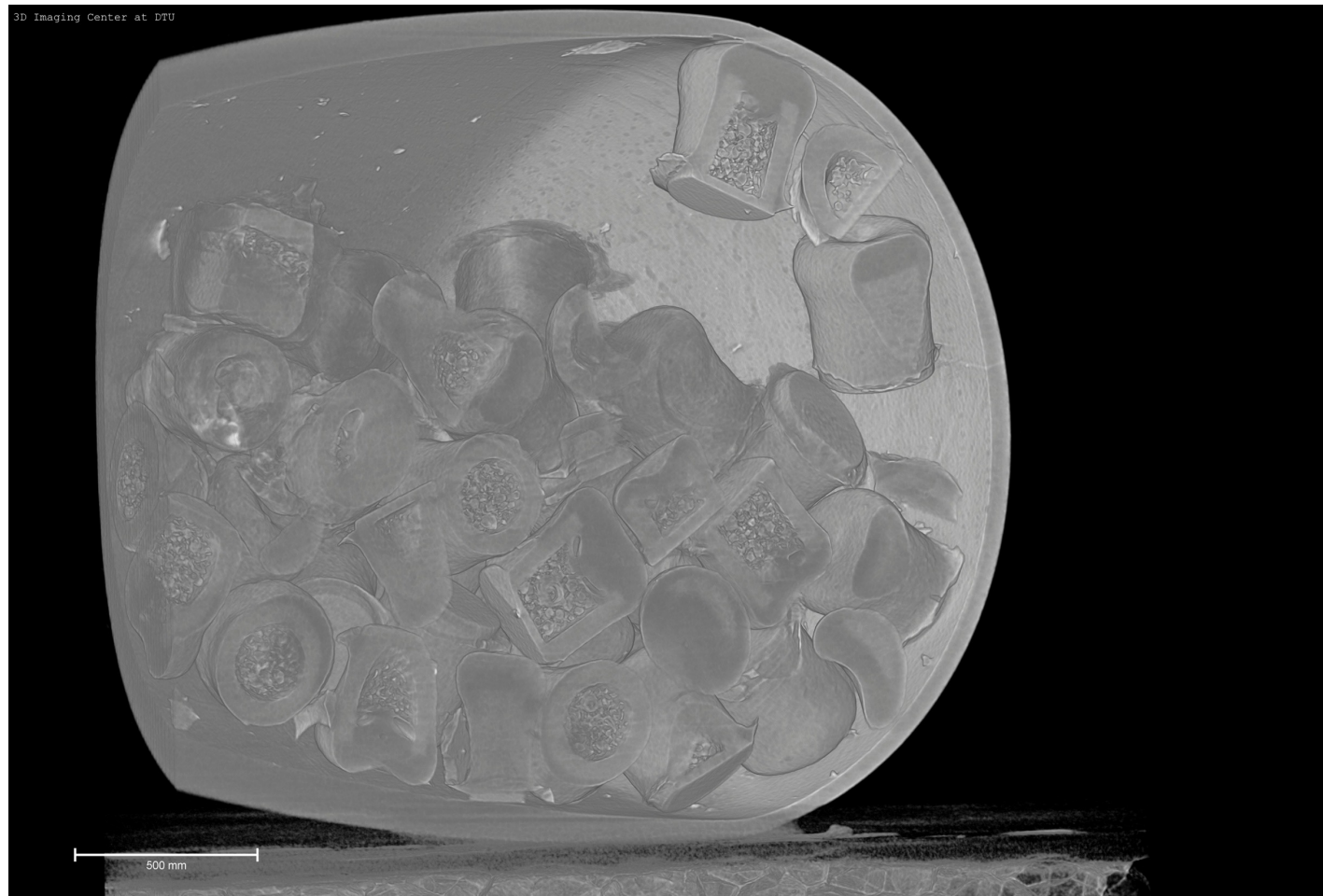
Collaboration with IDUN

Micro containers for drug delivery



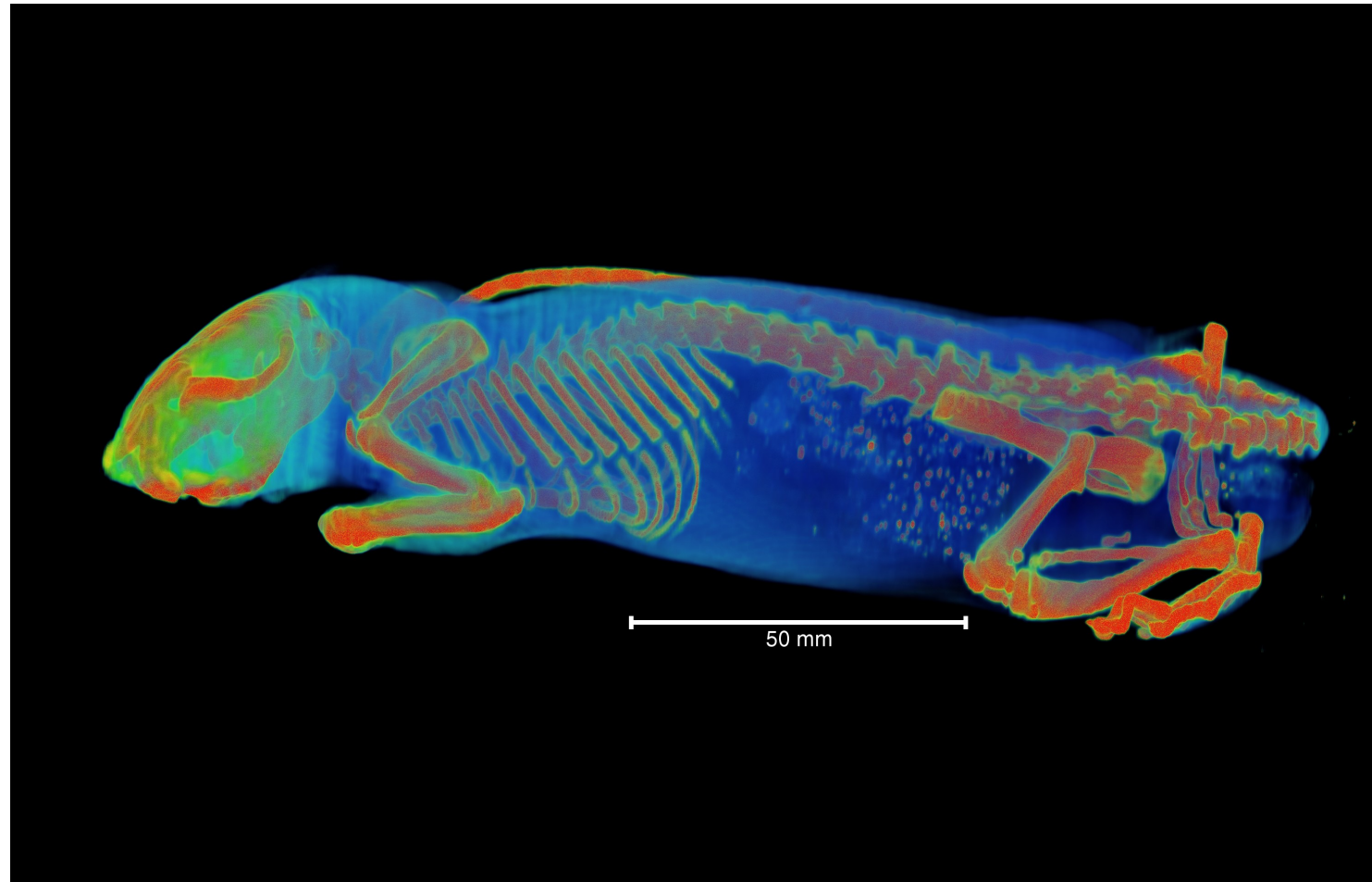
Collaboration with IDUN

Micro containers for drug delivery

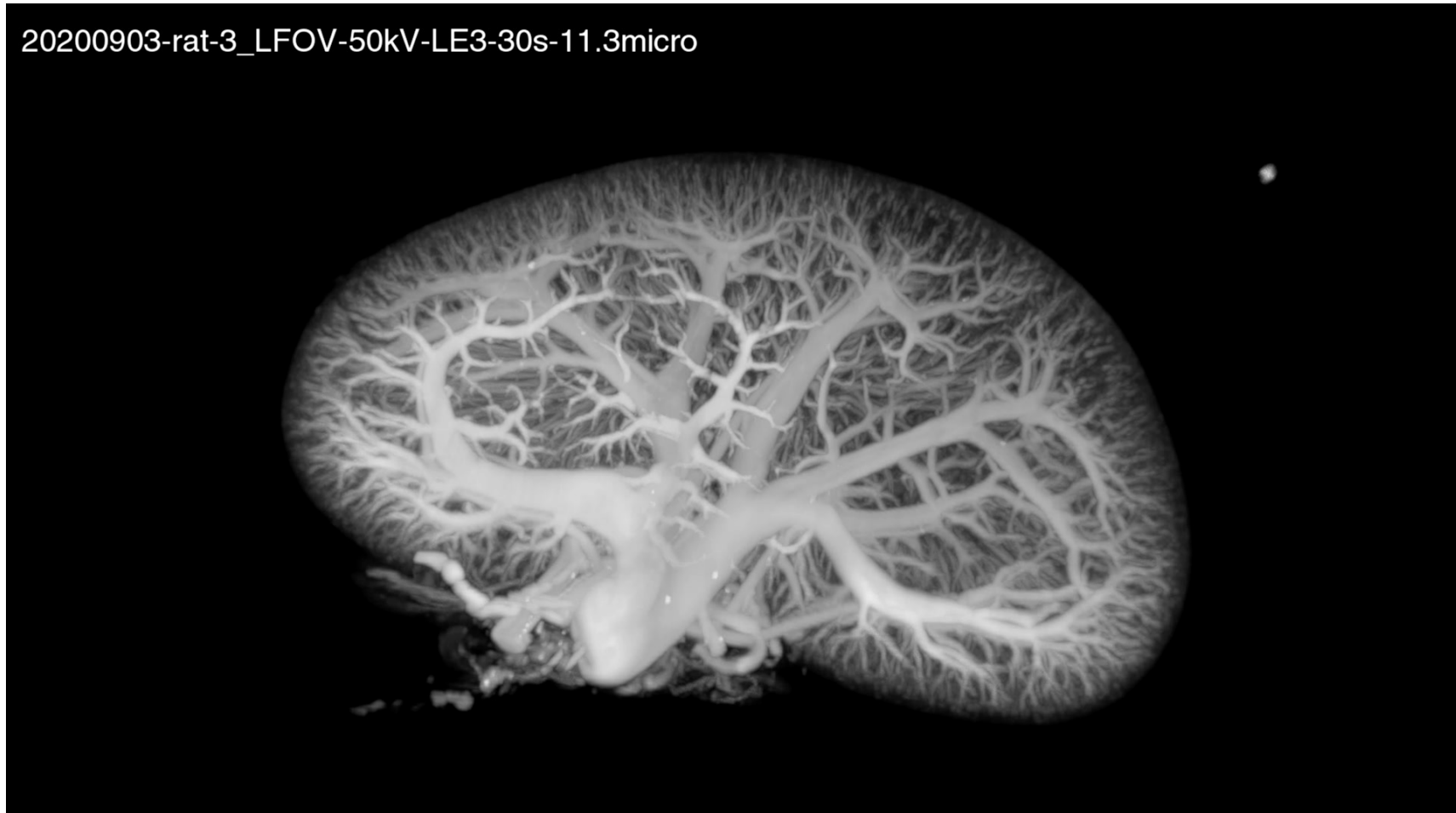


Collaboration with IDUN

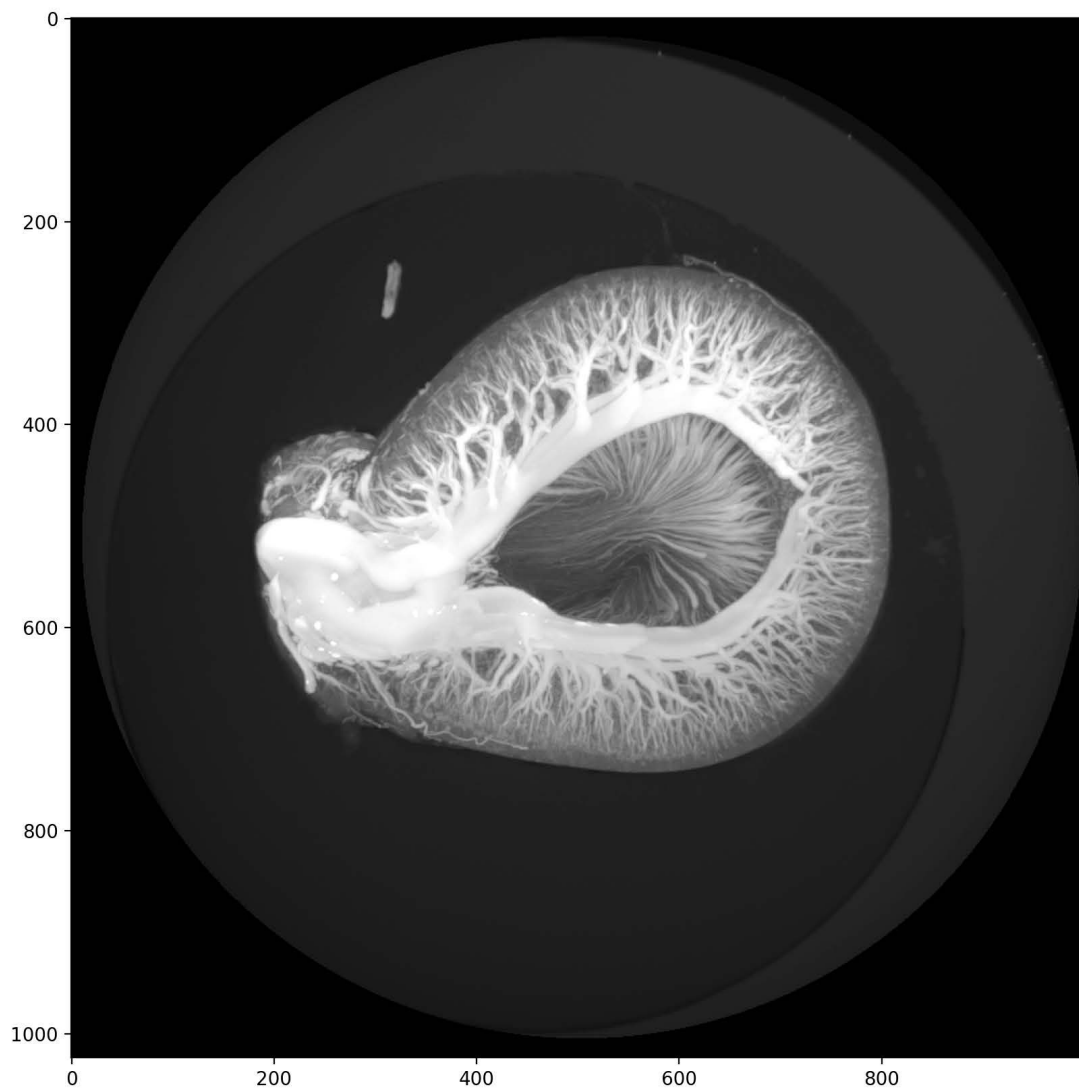
Micro container in rat



Rat Kidney



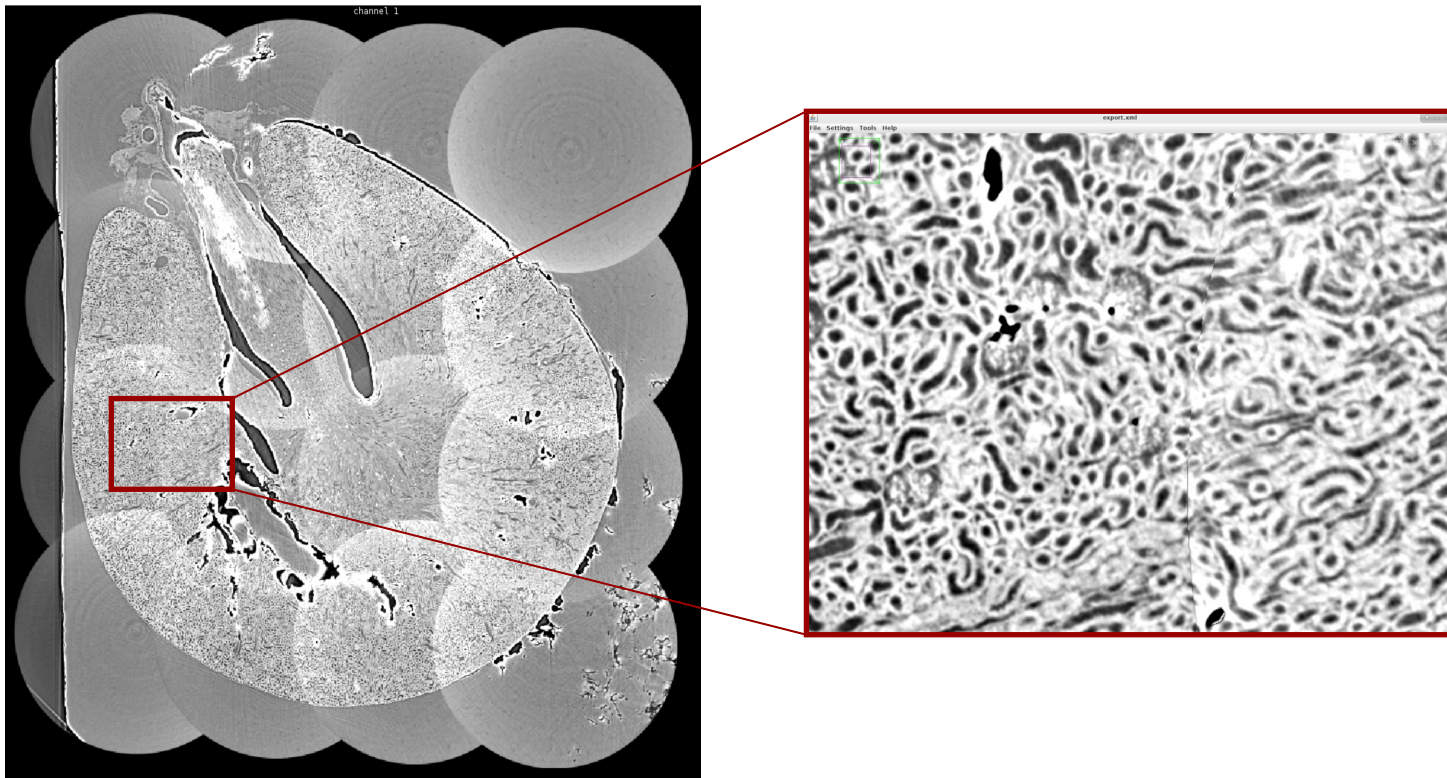
Collaboration with groups of Jørgen Ahrent Jensen and Charlotte Mehlin Sørensen



Collaboration with groups of Jørgen Ahrent Jensen and Charlotte Mehlin Sørensen

Project 3: Full kidney in 'high res'

- Synchrotron experiment
 - Effective volume size: ~ [5500 x 6300 x 9000]



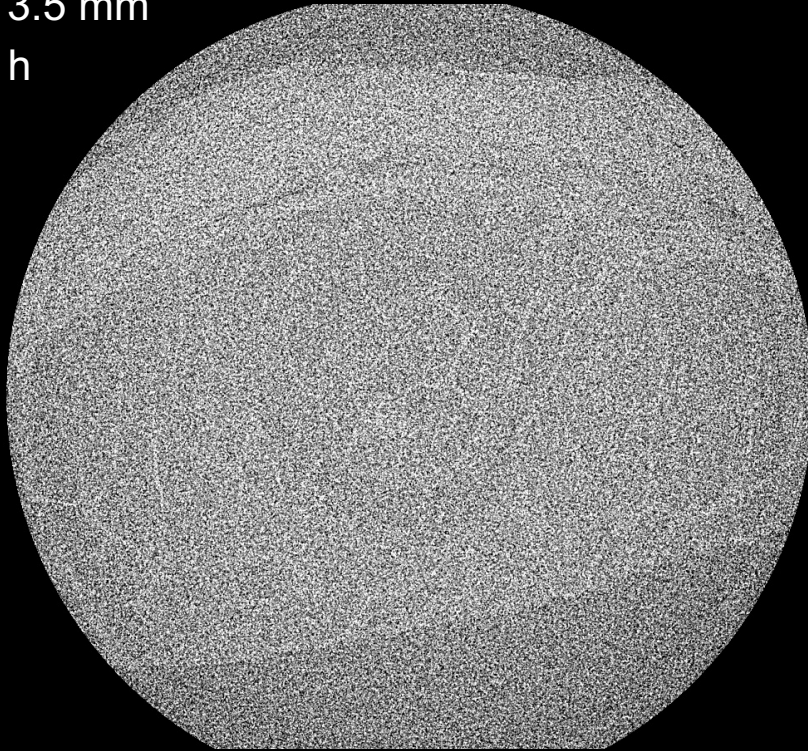
BiotoBank: optical nerve

Acquired with Zeiss Versa 520

Pixel size= 3.4 μm

Field of view= 3.5 mm

Scan time = 3 h

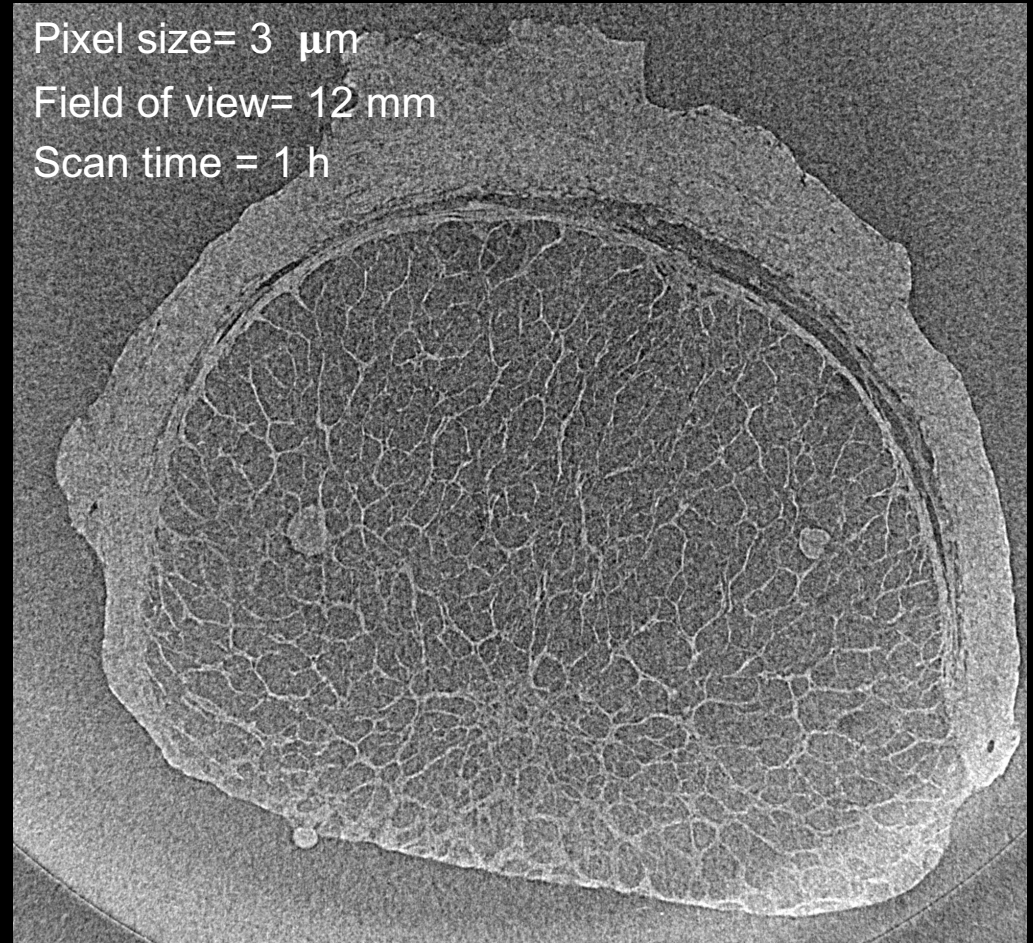


Acquired with exciscope

Pixel size= 3 μm

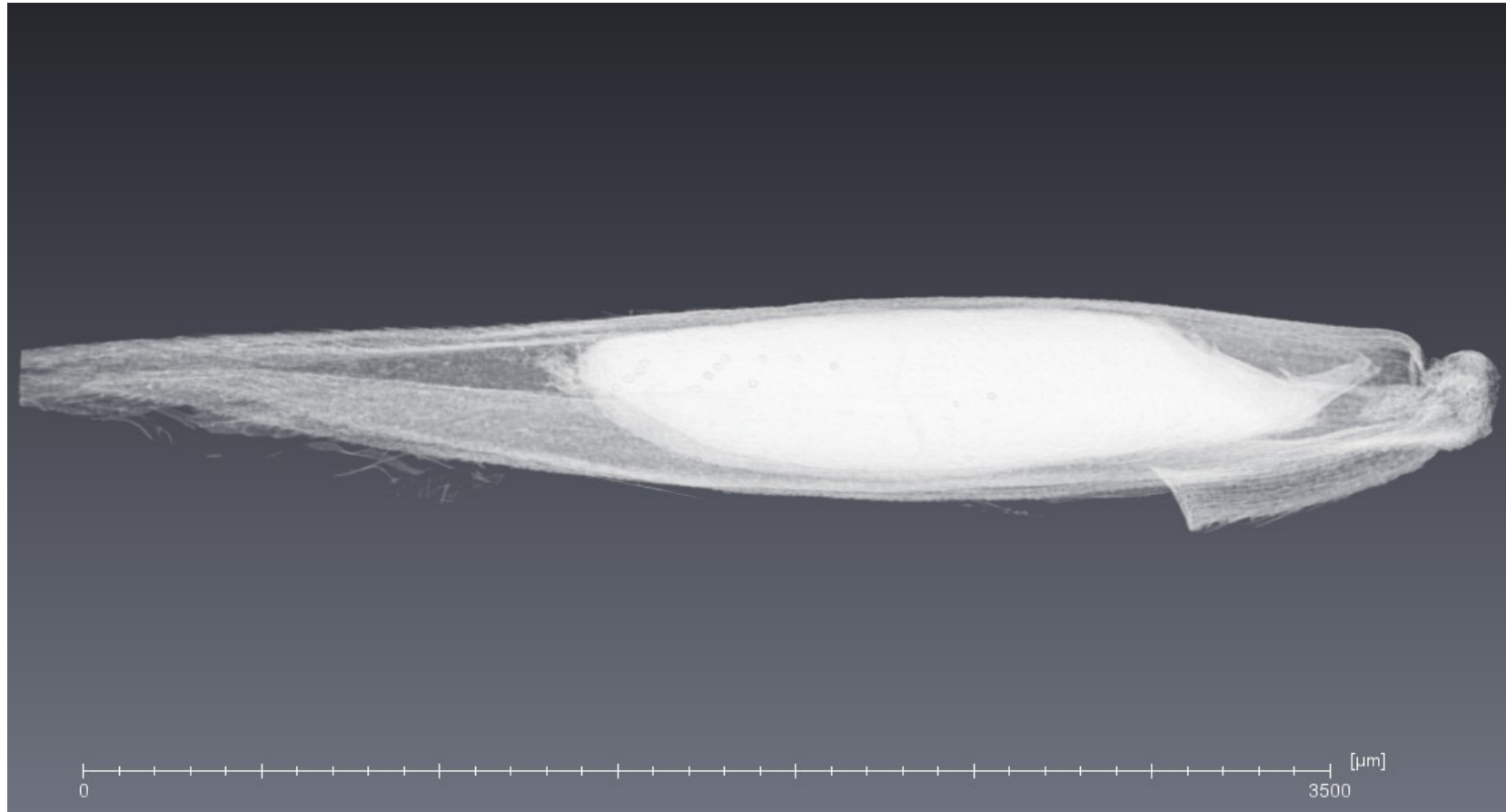
Field of view= 12 mm

Scan time = 1 h

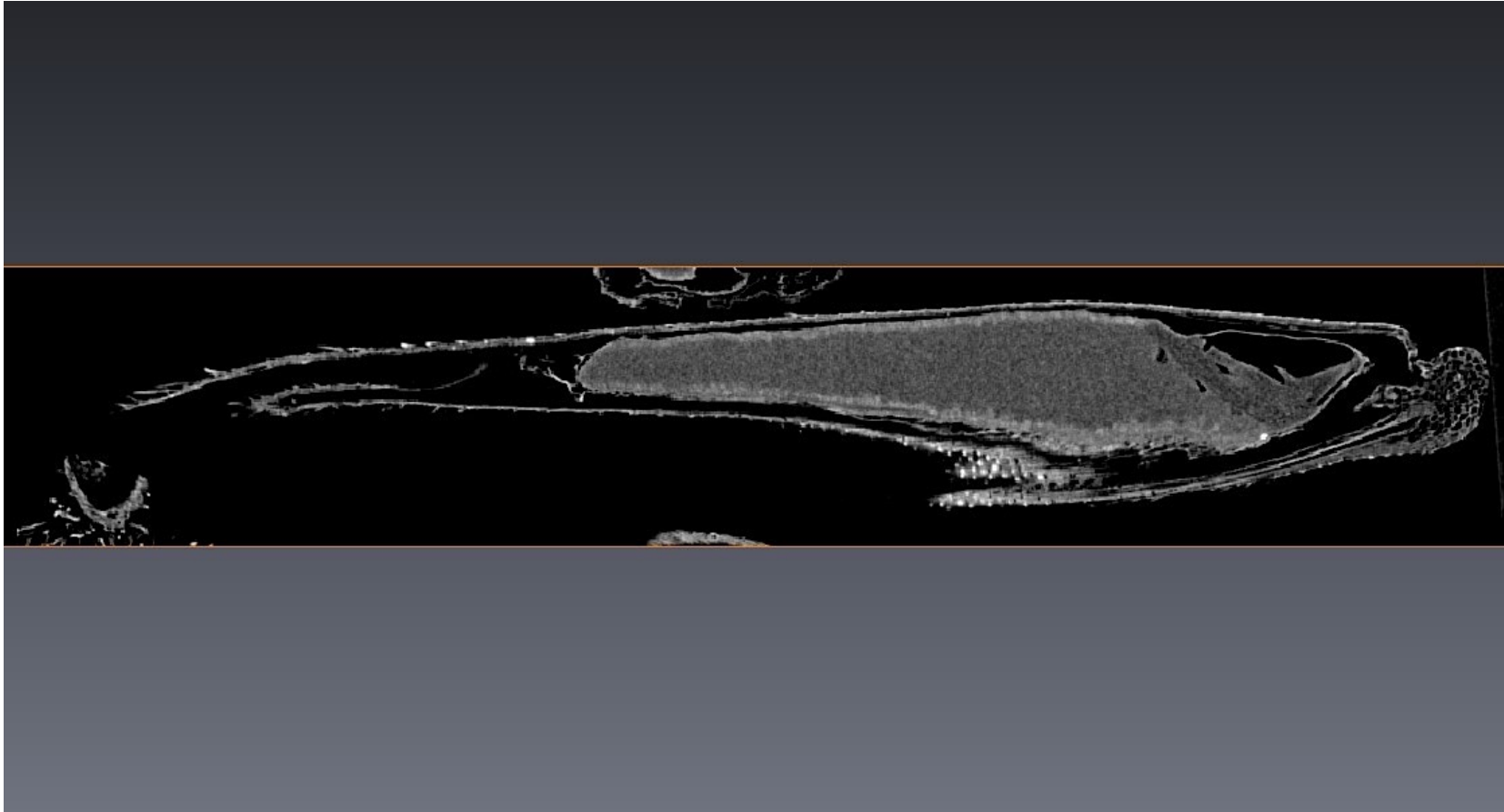


reference

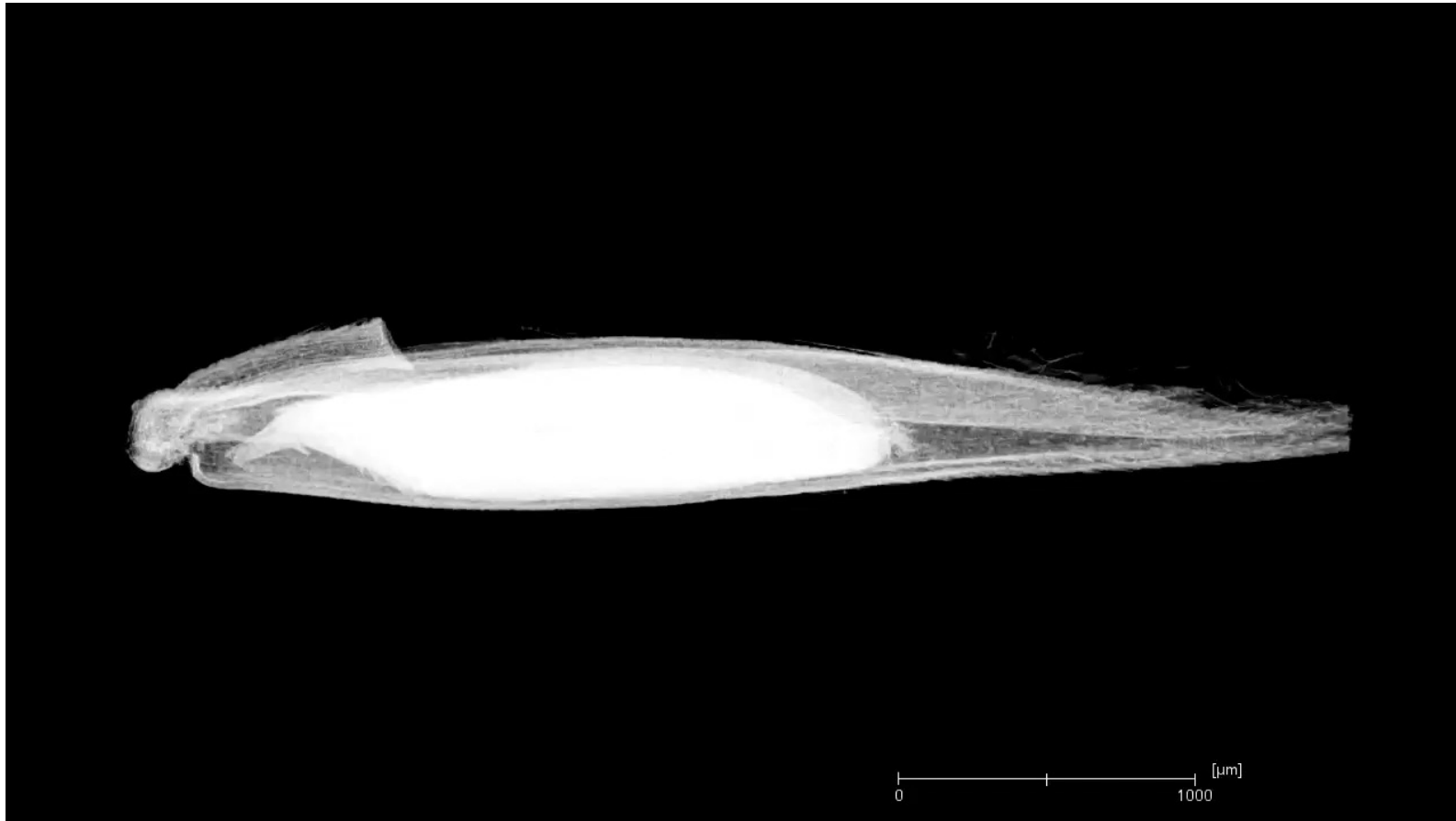
3D X-ray imaging of grass



3D X-ray imaging of grass



3D X-ray imaging of grass

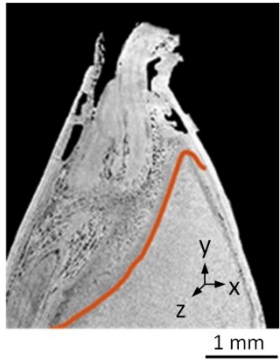


Micro-CT study of Barley micro-malting

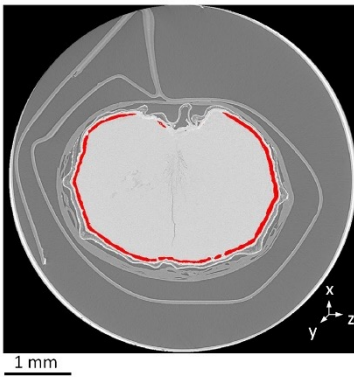
In this study we investigate the malting process of barley utilising micro-CT tomography, image analysis and biochemical analysis, connecting visual clues with enzyme activity kinetics. Using micro-CT, the 3D void network structure of the barley kernel is visualized. The proximal void located close to the crease and the whole void structure was filled with water from the third day into the malting process. The 3D void network may play an important role in water and nutrient translocation during germination, especially within the first 24 hours of malting. During malting, we did not observe a major difference in starch structure in both micro-CT images and the biochemical analysis. This is in agreement with previous knowledge of limited starch changes during malting. Furthermore, we found that cell wall structural components: arabinoxylan, xyloglucan, arabinogalactan proteins and pectin components show limited changes in amount and recalcitrance, whereas the amount of starchy endosperm localised beta-glucan and (gluco)mannans are reduced during malting, as expected. This is in contrast with our 3D micro-CT images of the aleurone layer, which shows a clear decrease in density, starting from the side of the grease and the scutellum. This we interpret as remobilisation of nutrients from the endosperm towards the germ without the breakdown of the cell walls of the aleurone layer. Note that both the central void and the starting point of aleurone layer disappearance locate near the grease. It is possible that the void system assists the transportation of nutrients distribution from the aleurone layer to the starchy endosperm

Image segmentation

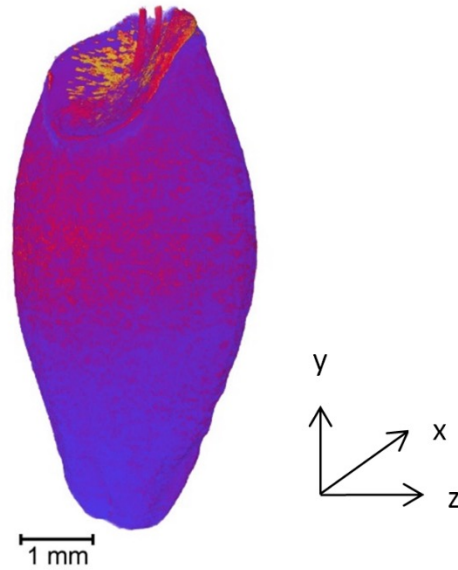
Layer detection



Random forest



Segmented kernel



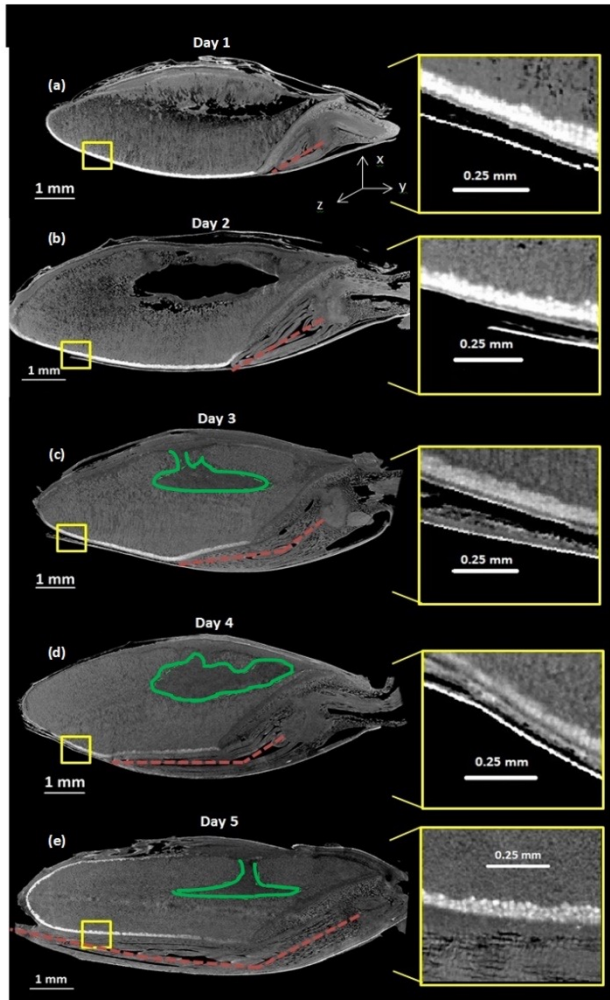
Crack in the kernel



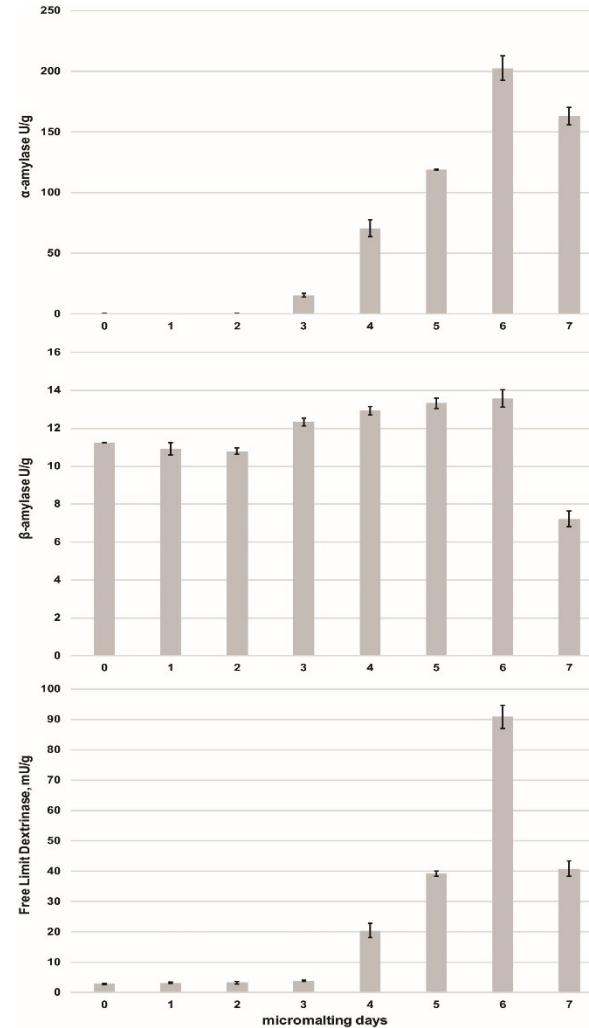
Due to the similar image intensity in the CT images, it is impossible to segment the structure of Barley based on thresholding based segmentation method. Therefore, we apply the layer detection to separate the embryo and the kernel, and use random forest segmentation method to extract the aleurone layer.

the kernel changes and enzyme analysis

CT slices



Enzyme activities

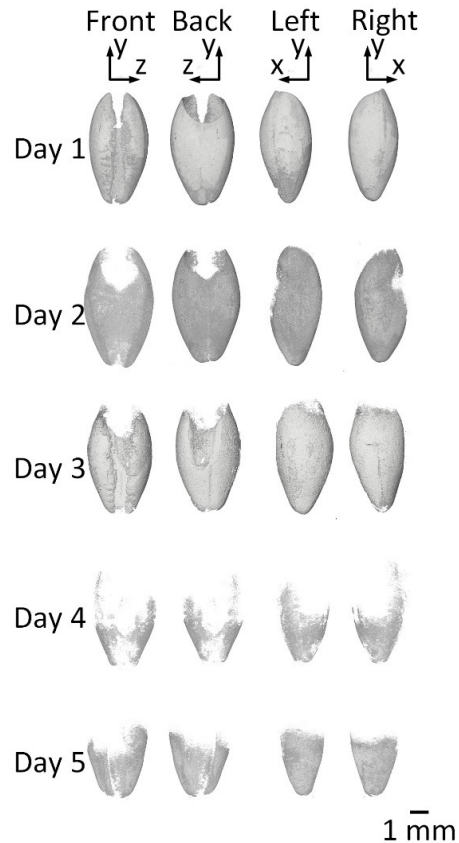


Conclusions

We did not see the degrading of the kernel in the first 5 days of the micromalting process, which matches literature reporting that in this stage, the kernel degradation is no more than 10%. The enzyme analysis also showed low enzyme activities in the first 5 days, which match the micro-CT observation.

the aleurone layer and cell wall analysis

Aleurone layer in 3D



Cell wall analysis

	(1→4)-β-D-galactan (mAb LM5)	(1→5)-α-L-arabinan (mAb LM6)	Linearised (1→5)-α-L-arabinan (mAb LM13)	Feruloylate on any polymer (mAb LM12)	(1→4)-β-D-(galacto)mannan (mAb BS-400-4)	(1→4)-β-D-(galacto)(gluco)mannan (mAb LM21)	(1→4)-β-D-(gluco)mannan (mAb LM22)	(1→3)(1→4)-β-D-glucan (mAb BS-400-3)	Xyloglucan (XXXG motif) (mAb LM15)	Xyloglucan / urisubstituted β-D-glucan (mAb LM25)	(1→4)-β-D-xylan (mAb LM10)	(1→4)-β-D-xylan/arabinoxylan (mAb LM11)	Anti-grass xylan preparations (mAb LM27)	Xylan (mAb LM28)	Extensin (mAb JIM20)	AGP (mAb JIM13)
CDTA																
Carl Day 0	0	20	0	0	99	69	0	0	0	0	0	26	0	8	0	8
Carl Day 1	0	17	0	20	100	67	0	0	0	18	0	23	0	0	0	9
Carl Day 2	0	16	0	16	100	67	0	0	0	13	0	22	0	4	0	8
Carl Day 3	0	15	0	17	96	66	0	0	8	8	0	23	0	0	0	7
Carl Day 4	0	16	0	13	79	48	0	0	0	7	0	20	0	3	0	7
Carl Day 5	3	21	0	11	65	35	0	0	0	7	0	16	0	3	0	6
Carl Day 6	0	19	0	12	42	19	0	0	0	7	0	11	0	6	0	6
Carl Day 7	0	22	0	13	43	19	0	0	0	9	0	12	0	4	0	7
NaOH																
Carl Day 0	19	23	11	0	32	16	0	63	10	14	0	65	0	44	0	0
Carl Day 1	17	23	9	0	25	11	0	62	8	13	0	68	0	43	0	0
Carl Day 2	19	23	11	0	34	13	0	78	10	18	0	69	6	43	0	0
Carl Day 3	20	23	10	0	34	13	0	67	10	18	0	69	6	41	0	0
Carl Day 4	21	20	9	0	27	9	0	45	11	16	0	65	7	39	0	0
Carl Day 5	22	23	9	0	23	8	0	42	12	19	0	67	8	49	0	0
Carl Day 6	22	21	8	0	20	6	0	38	13	19	0	62	9	43	0	0
Carl Day 7	25	25	9	0	22	7	0	40	15	24	0	69	13	61	0	0

Conclusions

The cell wall analysis shows that the cell wall is structurally intact, meaning the disappearing of the aleurone layer in the CT images is not due to the broke down of the cell wall, but more likely due to heavy materials, such as minerals and protein transportation crossing the cell wall.

Vascular flow

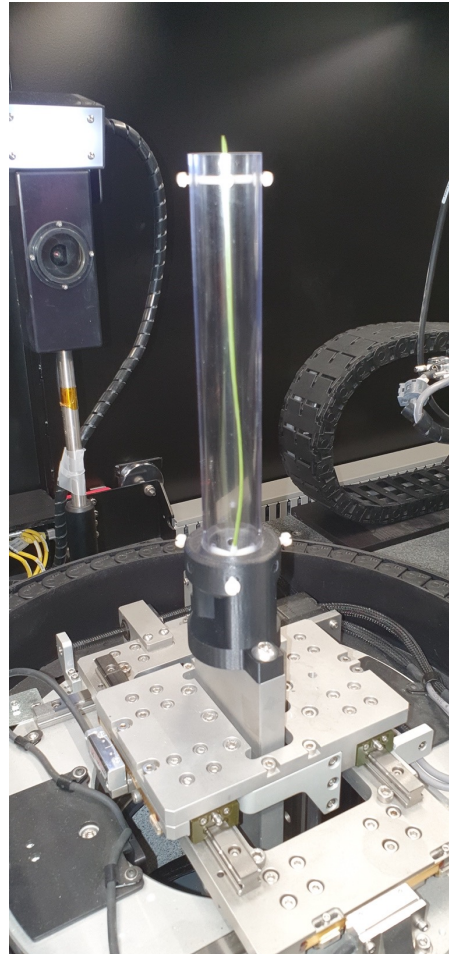
4X objective with 3.4 μm pixels

40kV and no filter

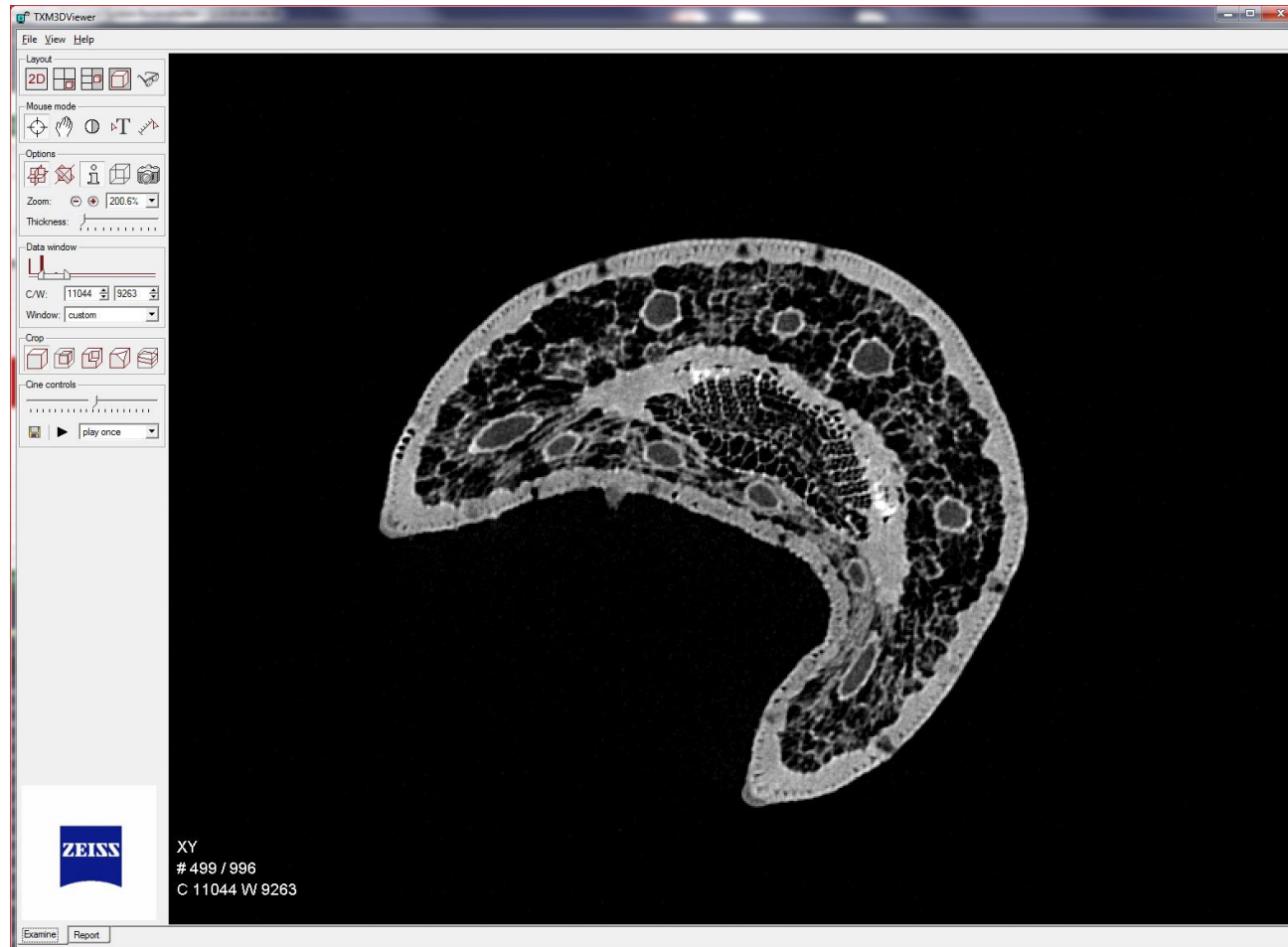
1601 projections

2 seconds exposure

1 hour 35 minutes



Vascular flow



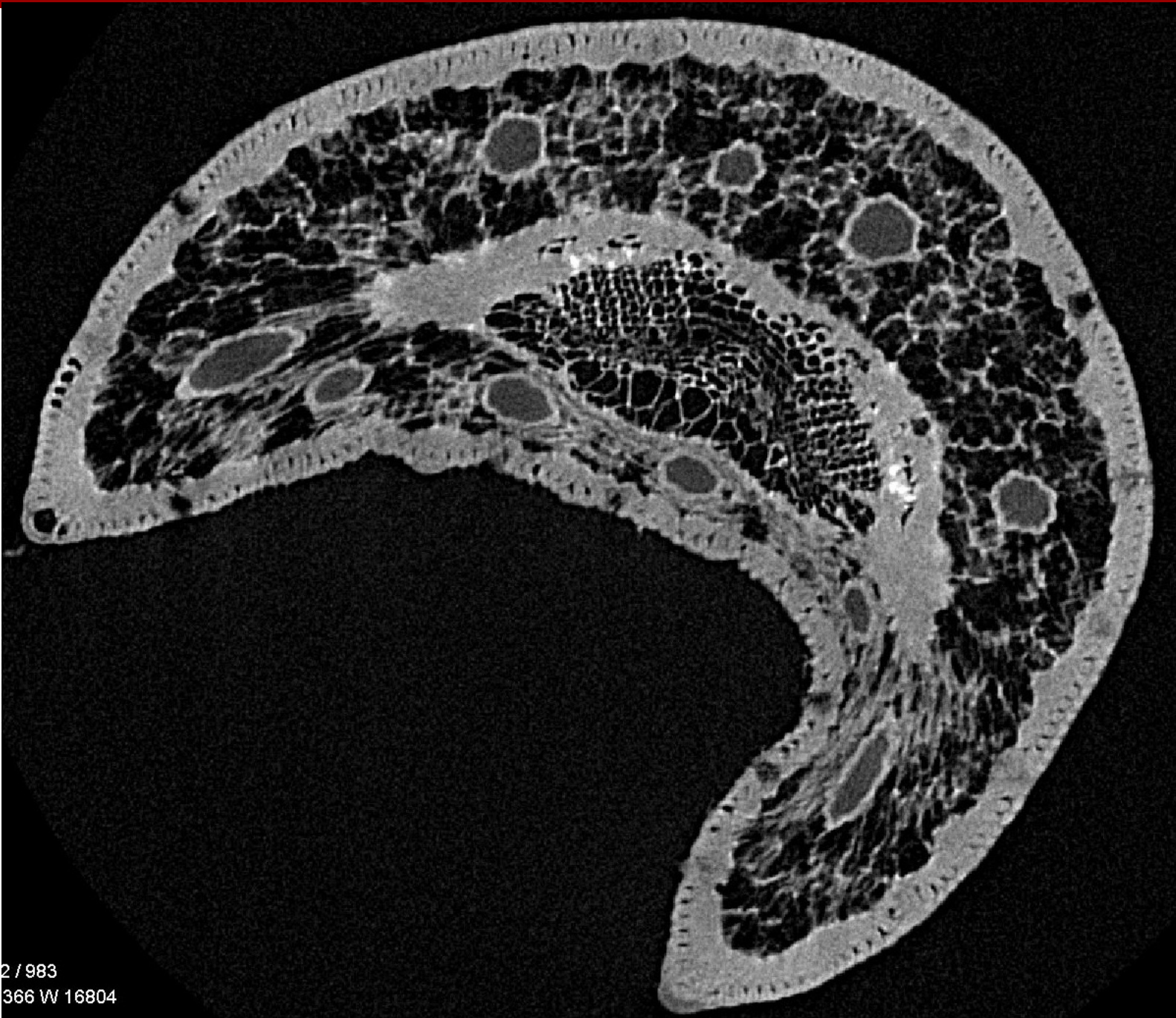
4X objective with 3.4 μm pixels
 40kV and no filter
 1601 projections
 2 seconds exposure
 1 hour 35 minutes



Vascular flow

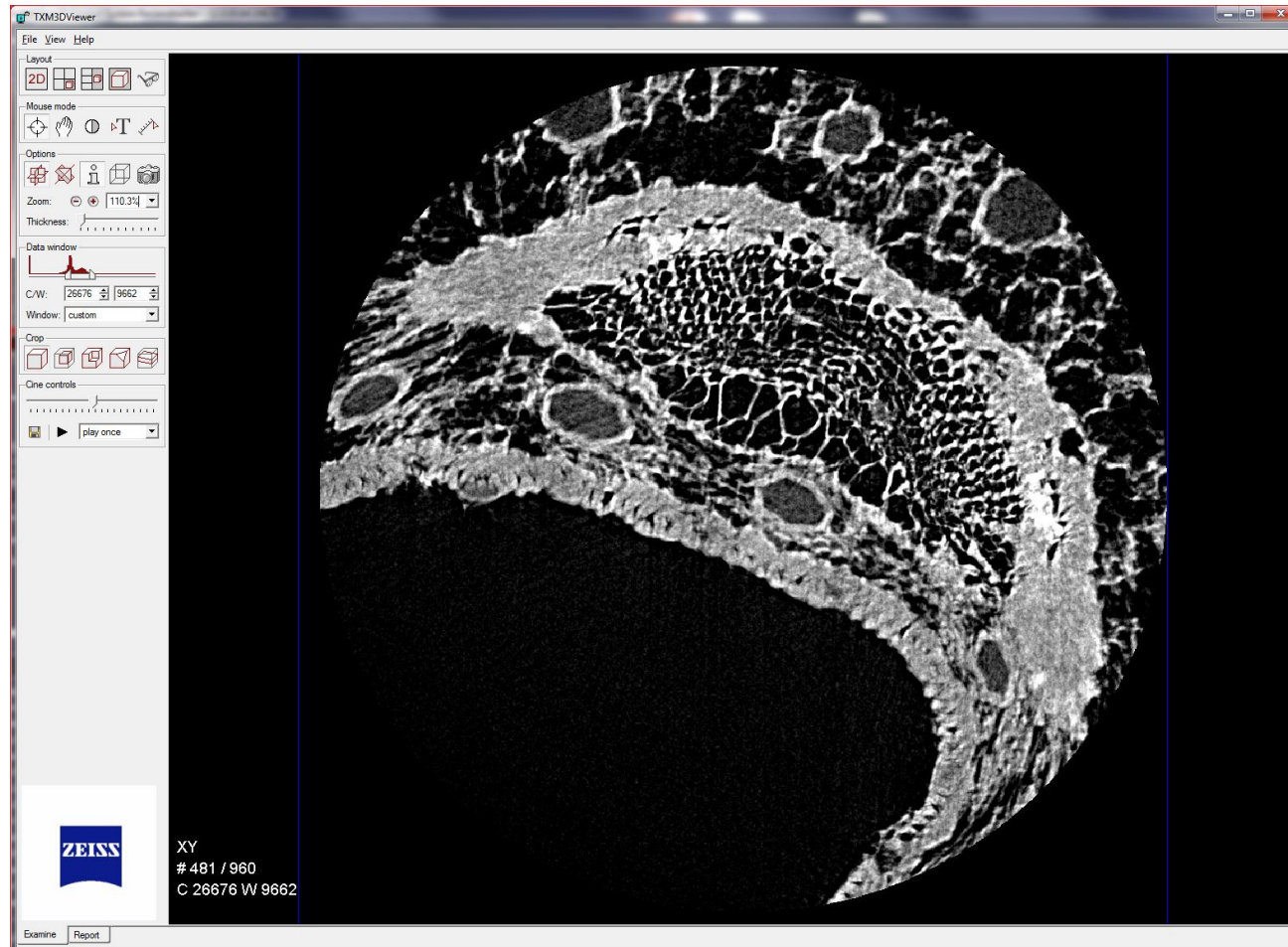


10X objective with 1.7 μm pixels
 40kV and no filter
 1601 projections
 5 seconds exposure
 2 hour 59 minutes

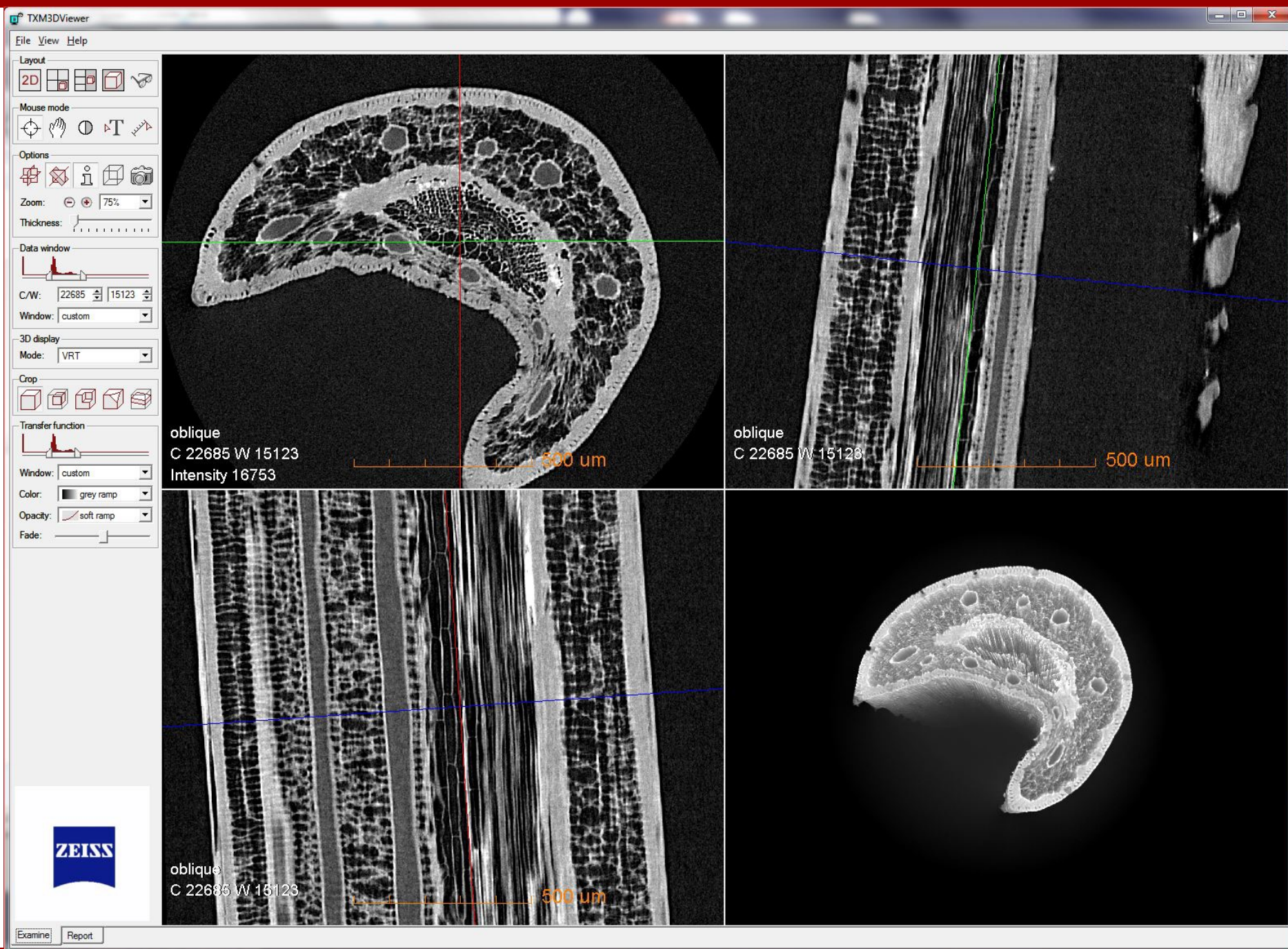


2 / 983
366 W 16804

Vascular flow



20X objective with 0.9 μm pixels
 40kV and no filter
 3201 projections
 20 seconds exposure
 19 hour 20 minutes



TXM3DViewer

File View Help

Layout: 2D, 3D, 2D/3D, 3D/2D, Rotate

Mouse mode: Pan, Rotate, Translate, Measure

Options: Hide, Show, Info, Rotate, Camera

Zoom: 49.9%

Thickness: [Slider]

Data window: [Histogram]

C/W: 25416, 17224

Window: custom

3D display: Mode: VRT

Crop: [Icons]

Transfer function: [Histogram]

Window: same as 2D slice

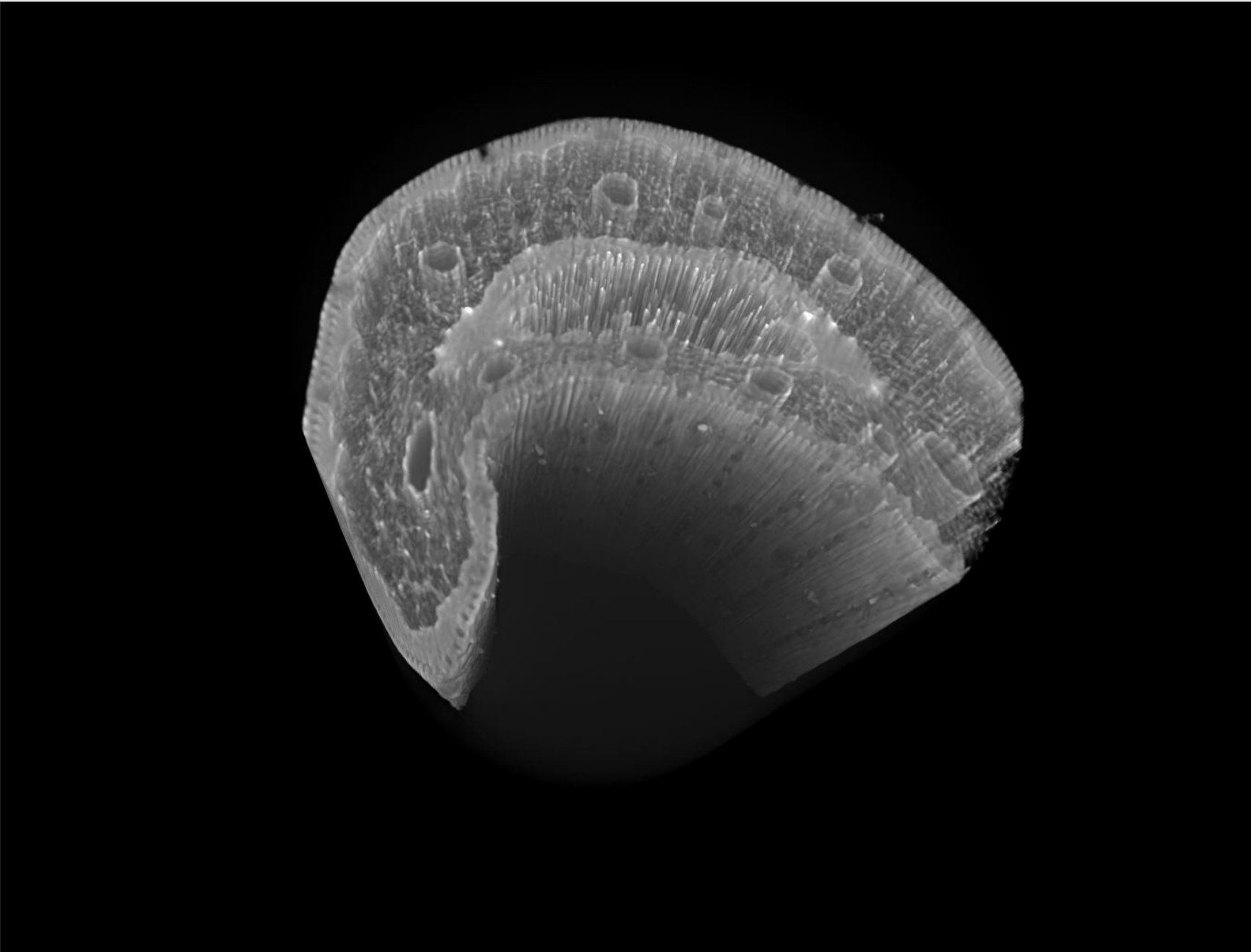
Color: grey ramp

Opacity: soft ramp

Fade: [Slider]

Cine controls: [Slider]

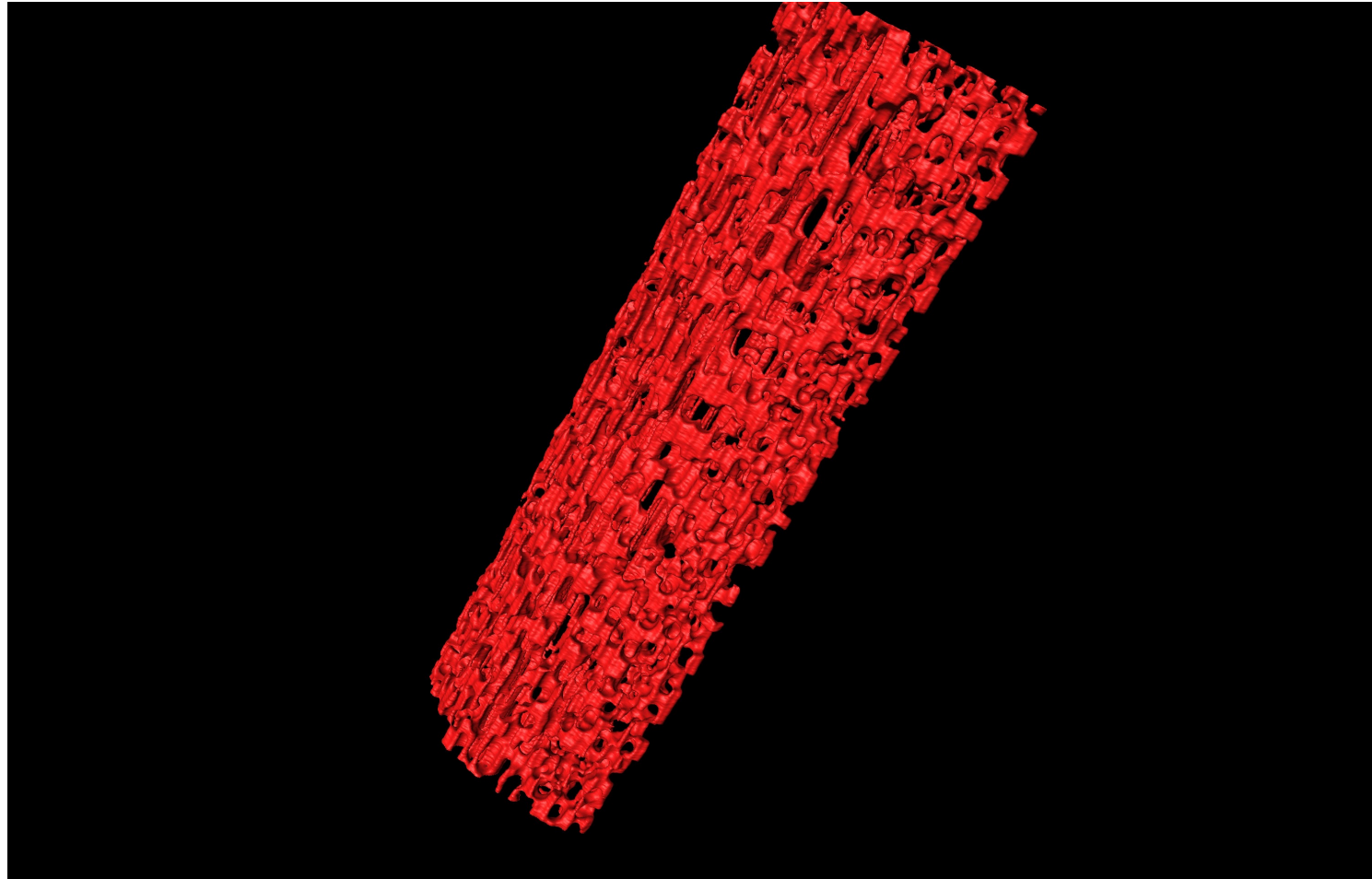
[Icons] play once



ZEISS

Examine Report

Vascular flow - segmentation



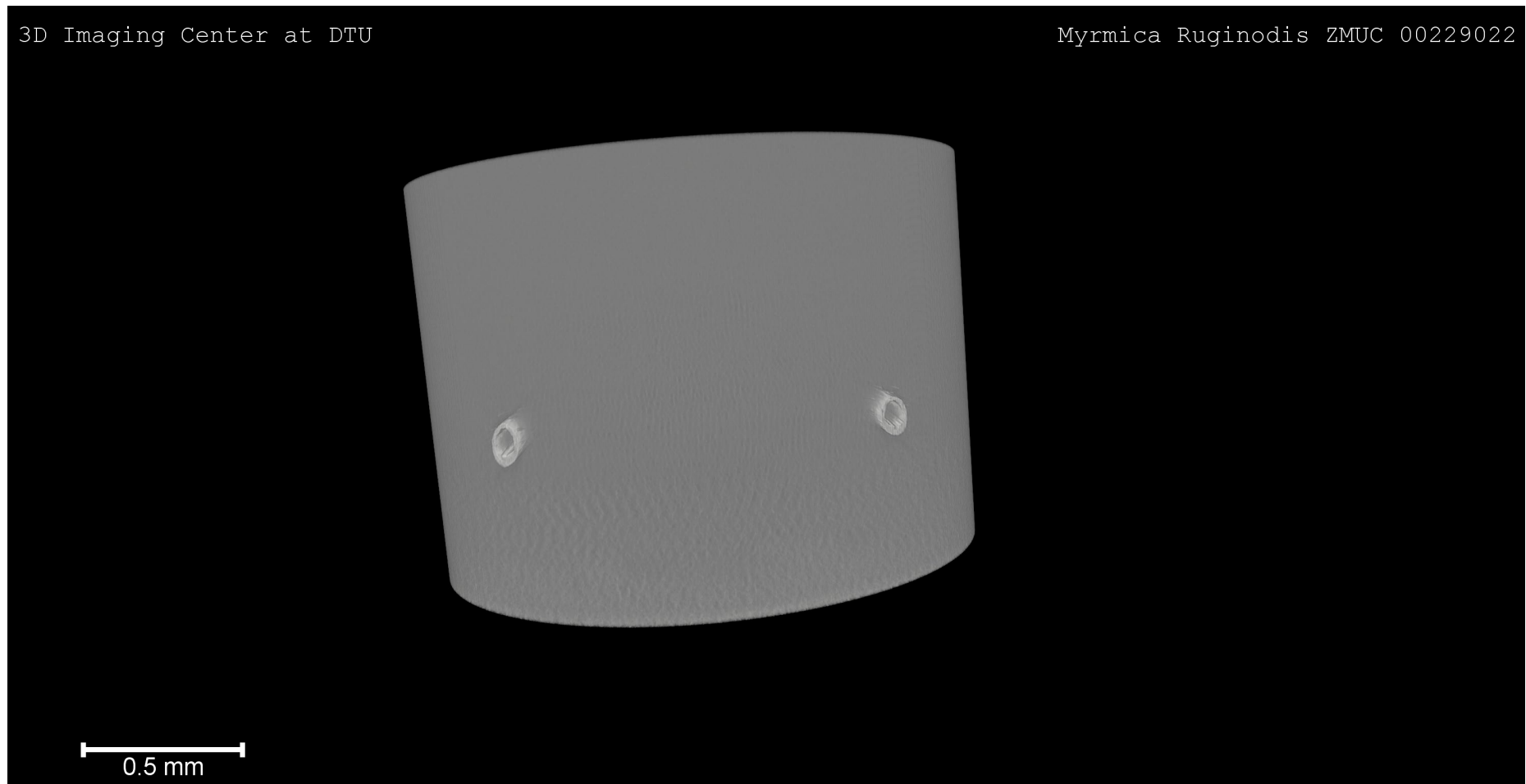
Insects

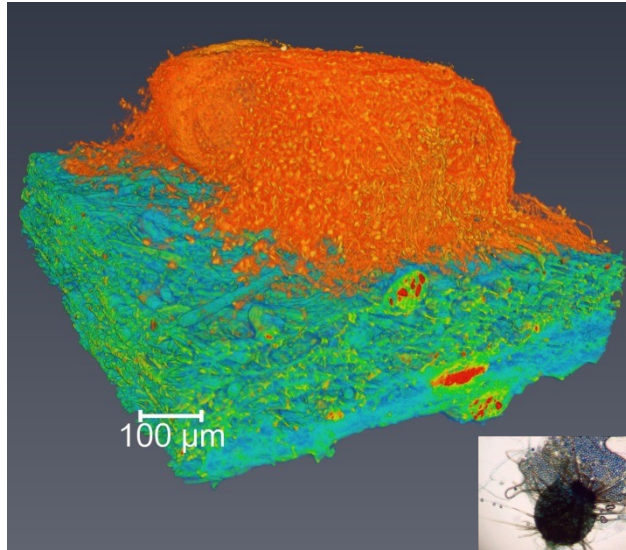


Mastigusa

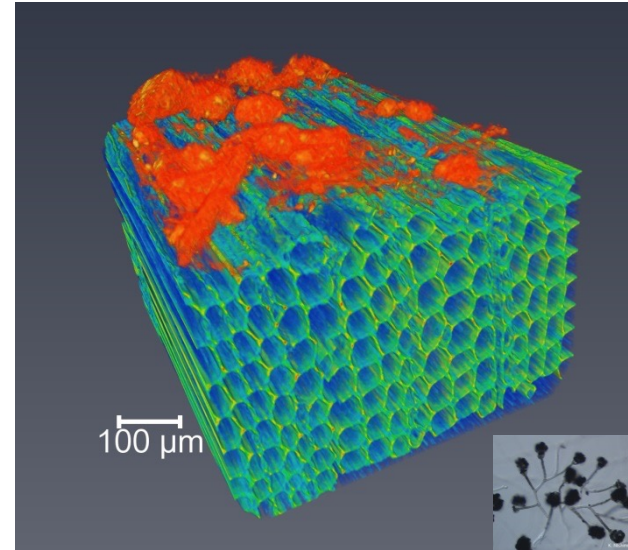


Hunt for ants

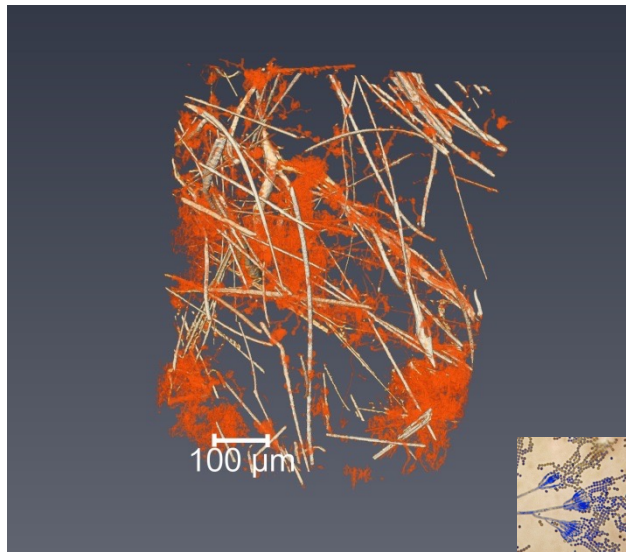




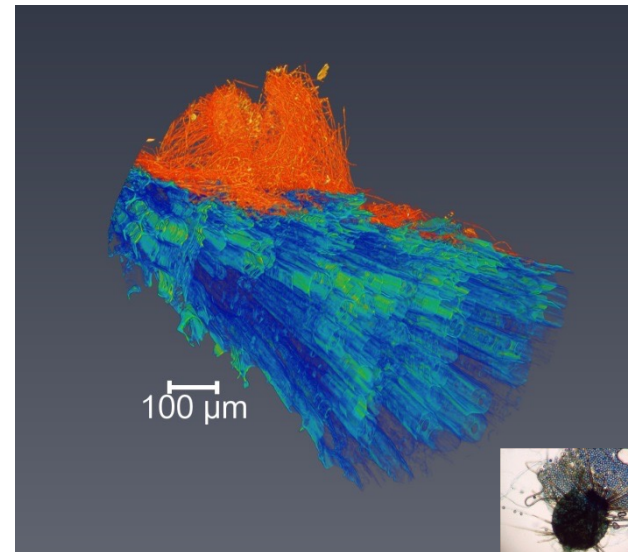
Chaetomium globosum in wall paper



Stachybotrys chartarum in plywood



Penicillium chrysogenum in stone wool



Chaetomium globosum in plywood

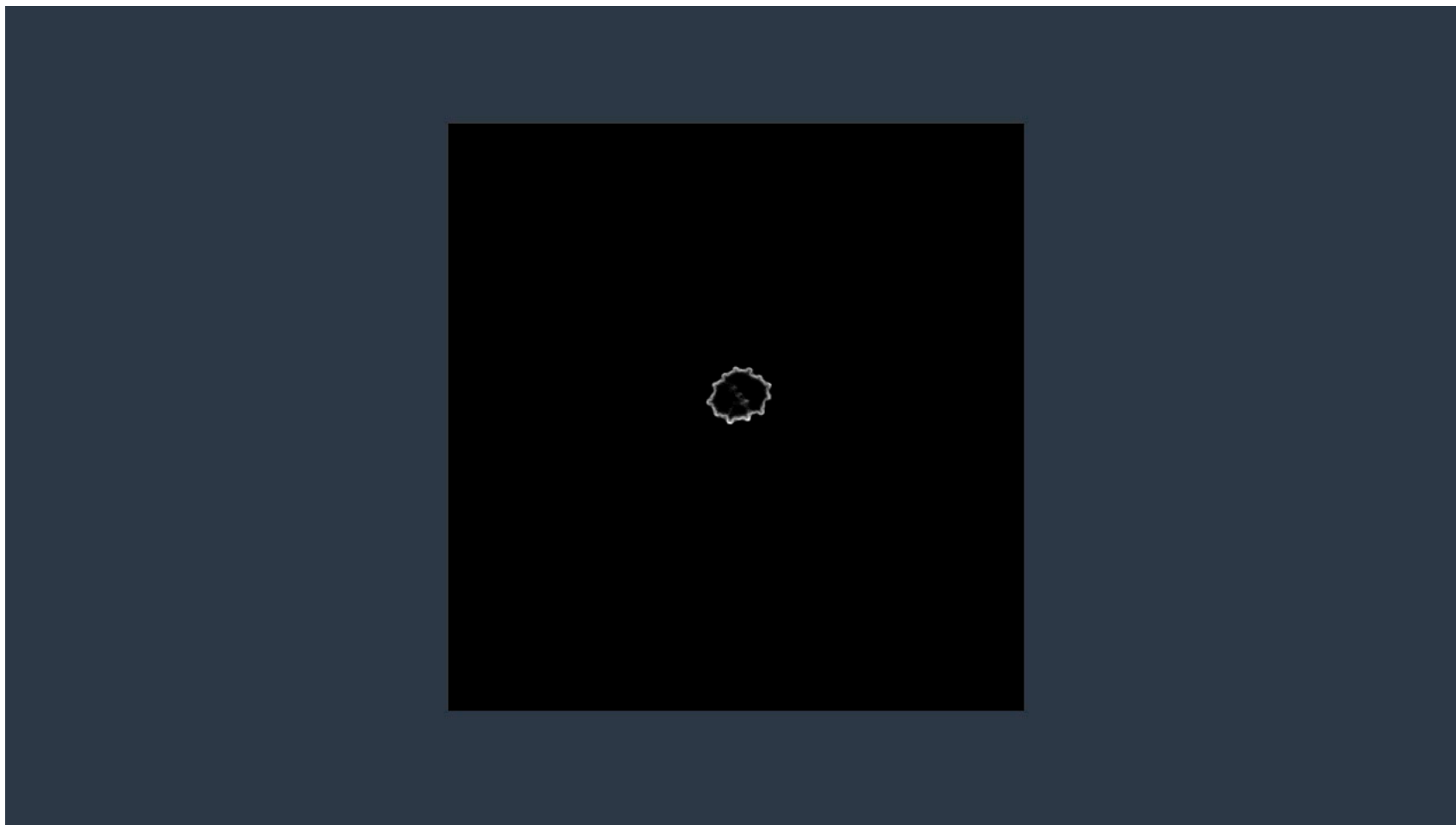
Skulls



Skulls



?



?



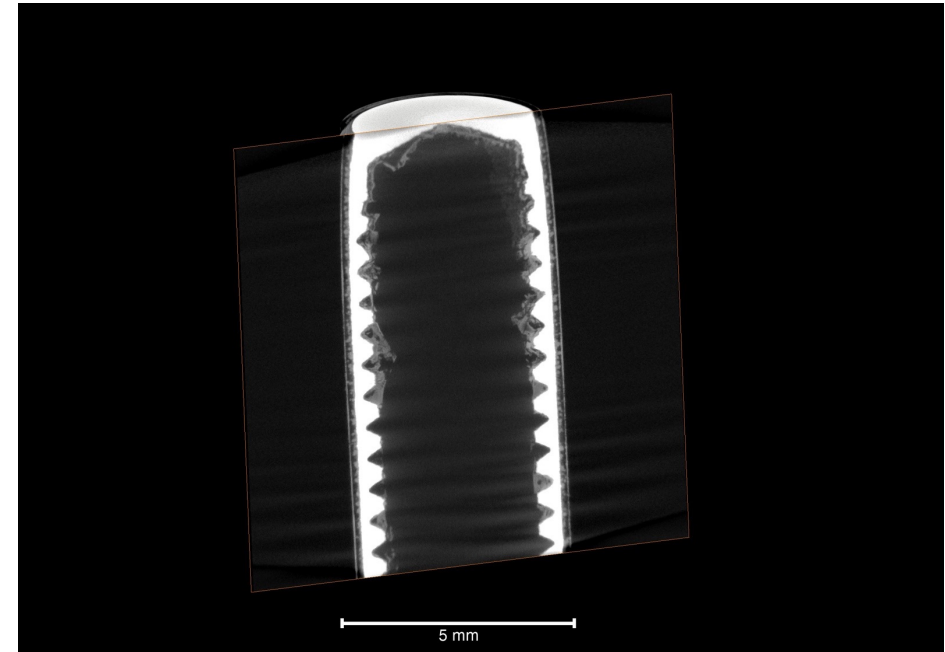
Food



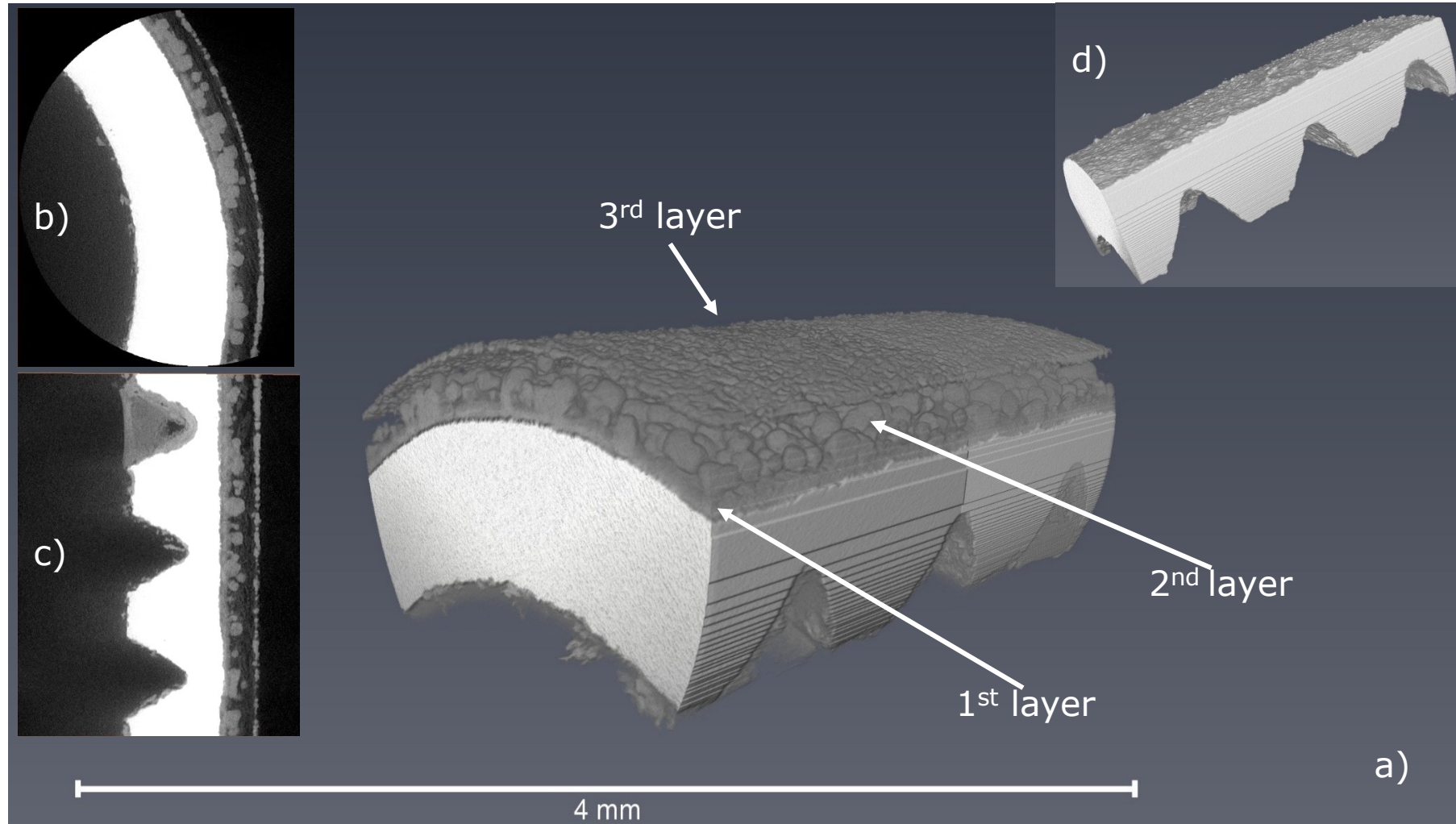
Corrosion studied by X-ray imaging

Example of corrosion on steel

- X-ray image of a large part of a steel pipe is shown.
- White areas are the steel.
- Weakly seen is also a surface layer of the pipe.
- Sediments from the corrosion are seen inside of the pipe.
- Possibility to look at a local scale



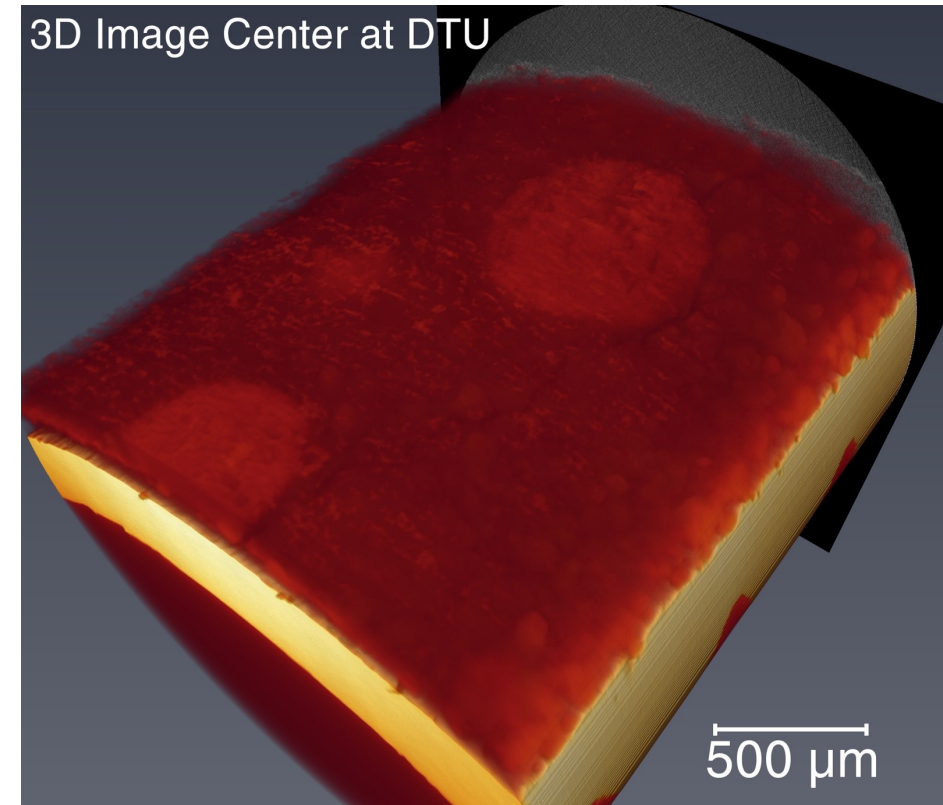
Corrosion studied by X-ray imaging



Corrosion studied by X-ray imaging

Visual inspection

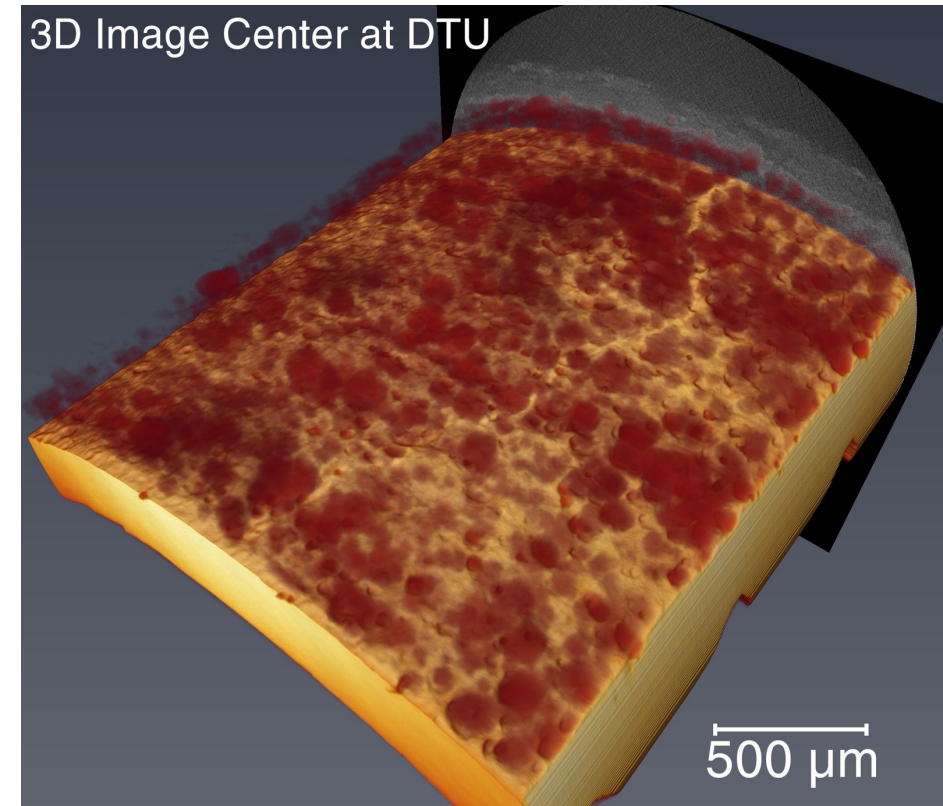
- From the 3D images it is possible to separate the different layers in the wall.
- Top layer in red



Corrosion studied by X-ray imaging

Visual inspection

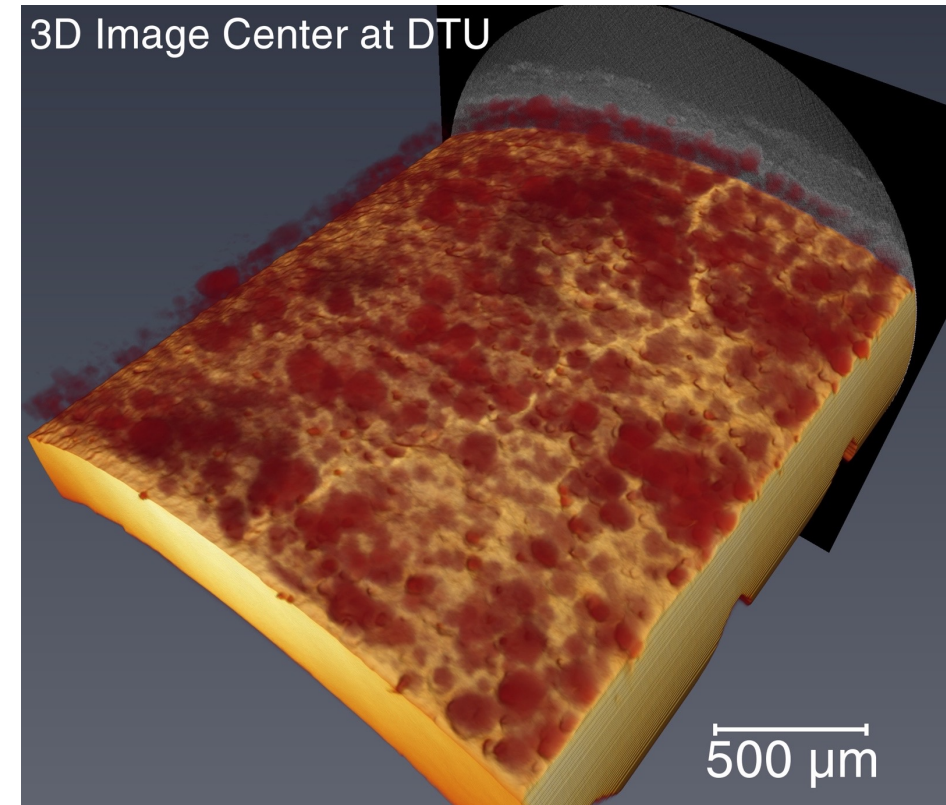
- From the 3D images it is possible to separate the different layers in the wall.
- Top layer in red



Corrosion studied by X-ray imaging

Visual inspection

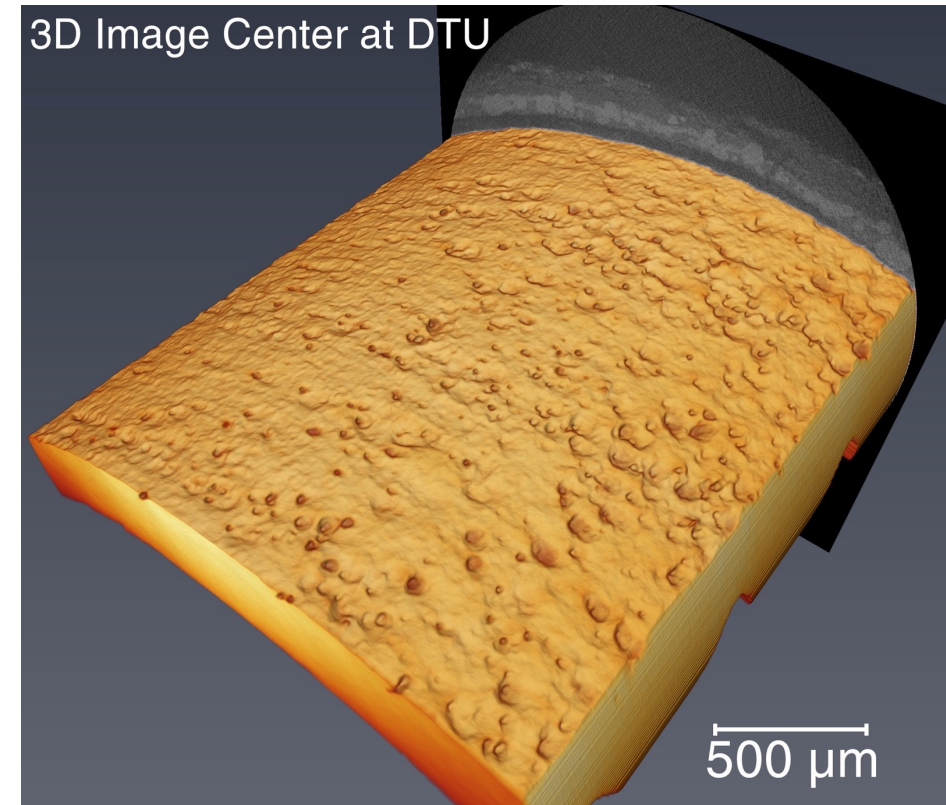
- From the 3D images it is possible to separate the different layers in the wall.
- Surface layer in red
- Effected sub-surface layer.



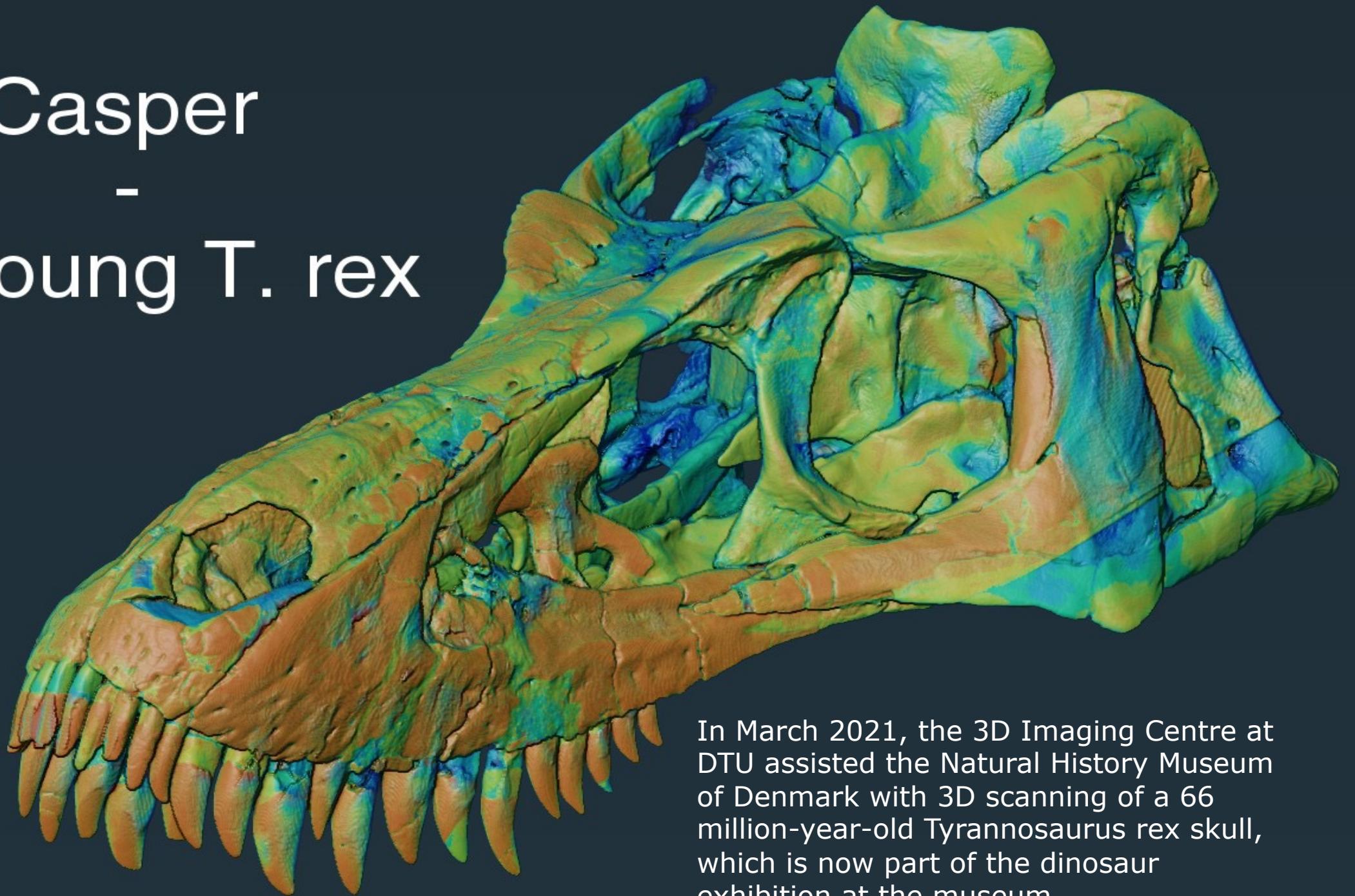
Corrosion studied by X-ray imaging

Visual inspection

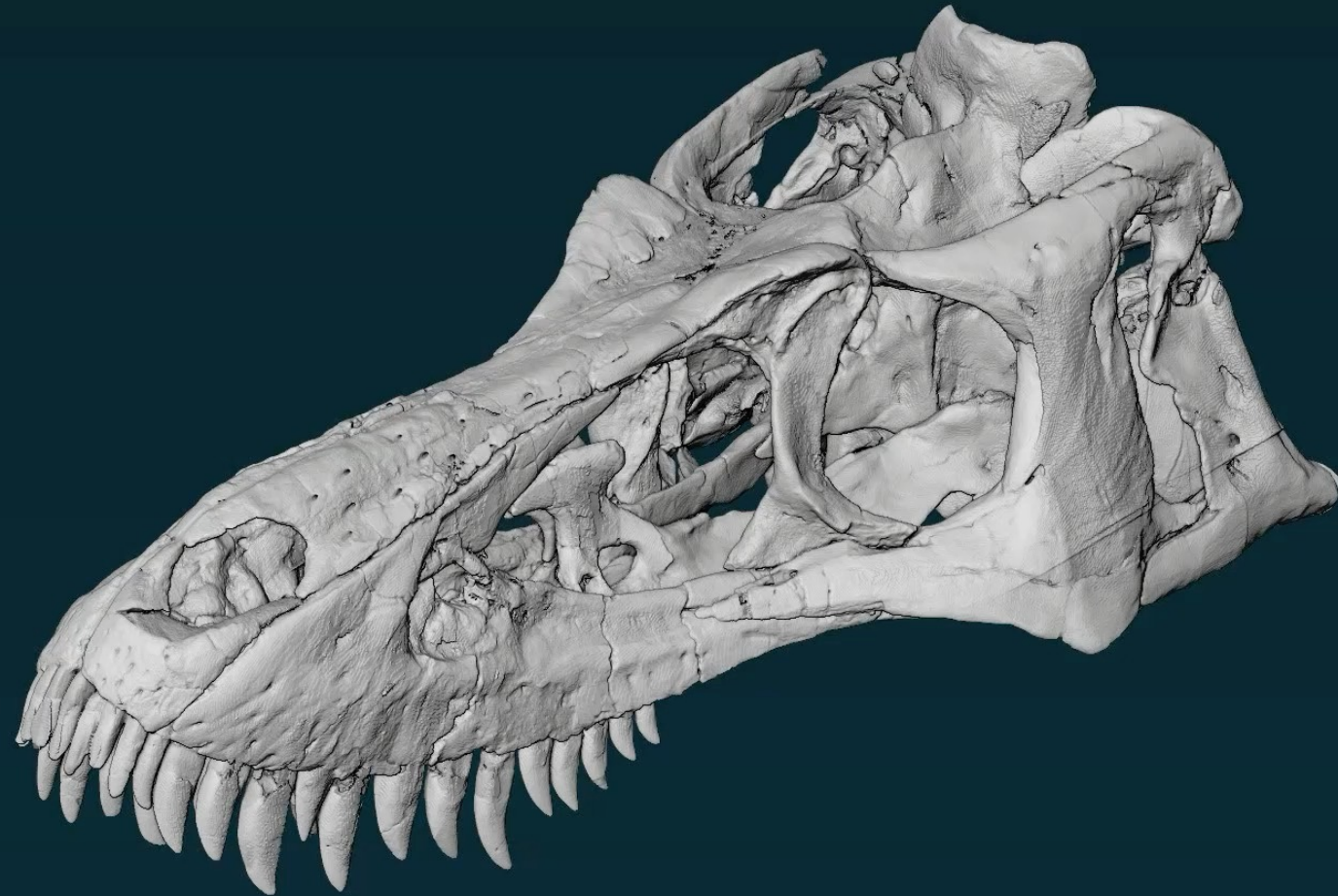
- From the 3D images it is possible to separate the different layers in the wall.
- Surface layer in red
- Effected sub-surface layer
- Un-effected wall layer



Casper
-
a young T. rex



In March 2021, the 3D Imaging Centre at DTU assisted the Natural History Museum of Denmark with 3D scanning of a 66 million-year-old Tyrannosaurus rex skull, which is now part of the dinosaur exhibition at the museum.



250 mm

Questions?

