

## Anthropomorphic Phantoms for Medical Imaging based on 3D printing: The role of Micro-CT Imaging for Manufacturing Quality Control

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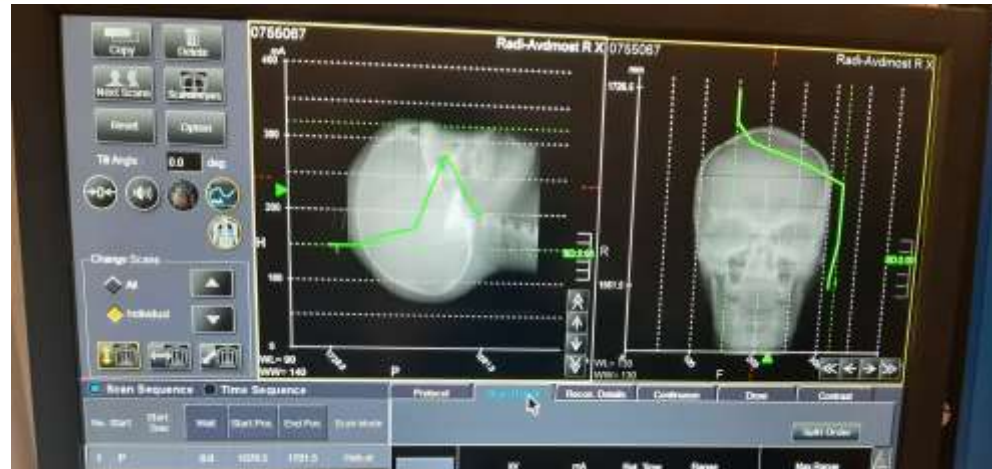
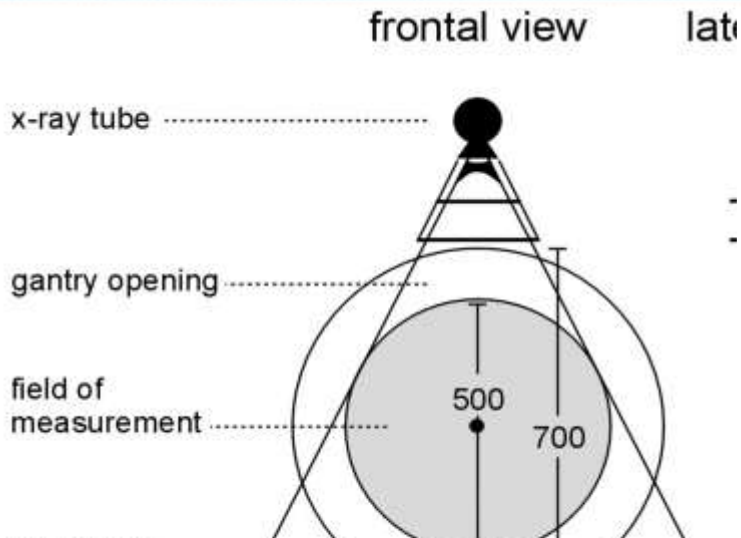
# Content

- Basic introduction to CT imaging
- Main differences between medical CT and micro-CT imaging
- Image quality (IQ) assessment from Physics point of view
- Diagnostic image quality
- Evolution of test objects or phantoms: from geometric to anthropomorphic
- Task-based image quality metrics: lesion detection, vessel detection and quantification
- Workflow to design and manufacture lung vessel anthropomorphic phantoms based on 3D printing
- Micro-CT imaging for QC of phantoms

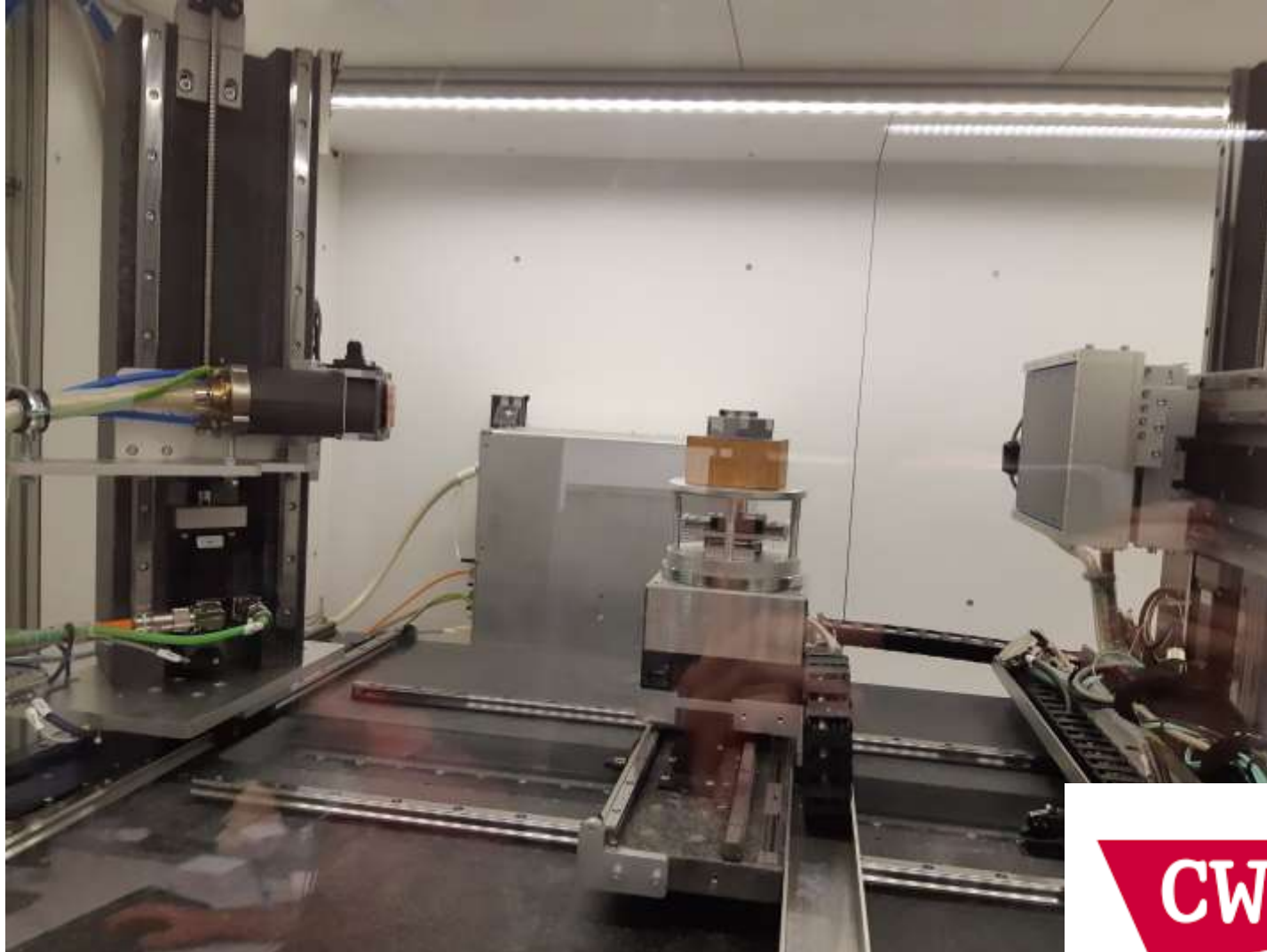
# Abstract

The performance evaluation of medical imaging devices has traditionally been done with test objects (phantoms) based on simple geometries (such as cylinders, for instance) cast on materials mimicking to some extent the patient overall X-ray attenuation. Such geometric phantoms contain different patterns for image quality assessment, like noise, uniformity, linearity of materials attenuation, modulation transfer function...<sup>1</sup> State of the art medical imaging devices, are intrinsically tailored to the human body characteristics, for instance with automatic exposure control systems calibrated for patients' morphometry or iterative and AI-based image reconstruction algorithms which make assumptions about the patient's characteristics or are trained with patient data. There is a need for expanding the medical image quality assessment framework, including anthropomorphic test objects, mimicking to some extent the overall patient attenuation, shape and morphometry, tissue texture and attenuation and others to some extent. The use of 3D printing plays a significant role in this regard, allowing for manufacturing customized patient anatomical models tailored to specific body parts or medical indications<sup>2,3</sup>. There is an interest in the medical physics community for these anthropomorphic phantoms with applications for X-ray imaging modalities, for instance Computed Tomography, and for others without the use of ionizing radiation (such as ultrasound or MRI). The accuracy, reproducibility and robustness of the 3d printing process is an expanding field, as there are several manufacturing providers, models, printing techniques, and a wide range of materials available. Micro-CT imaging can play an important role to assess the quality and characteristics of the developed anthropomorphic phantoms, generating ground truths of the objects that can be compared to the original models that were intended to be printed. Some case studies will be presented, ranging from simple 3D printed objects to more complex vessel-like structures, the latter intended to be an anthropomorphic phantom for image quality assessment of Computed Tomography systems<sup>4</sup>.

# CT imaging (Radiology)



# Micro-CT imaging

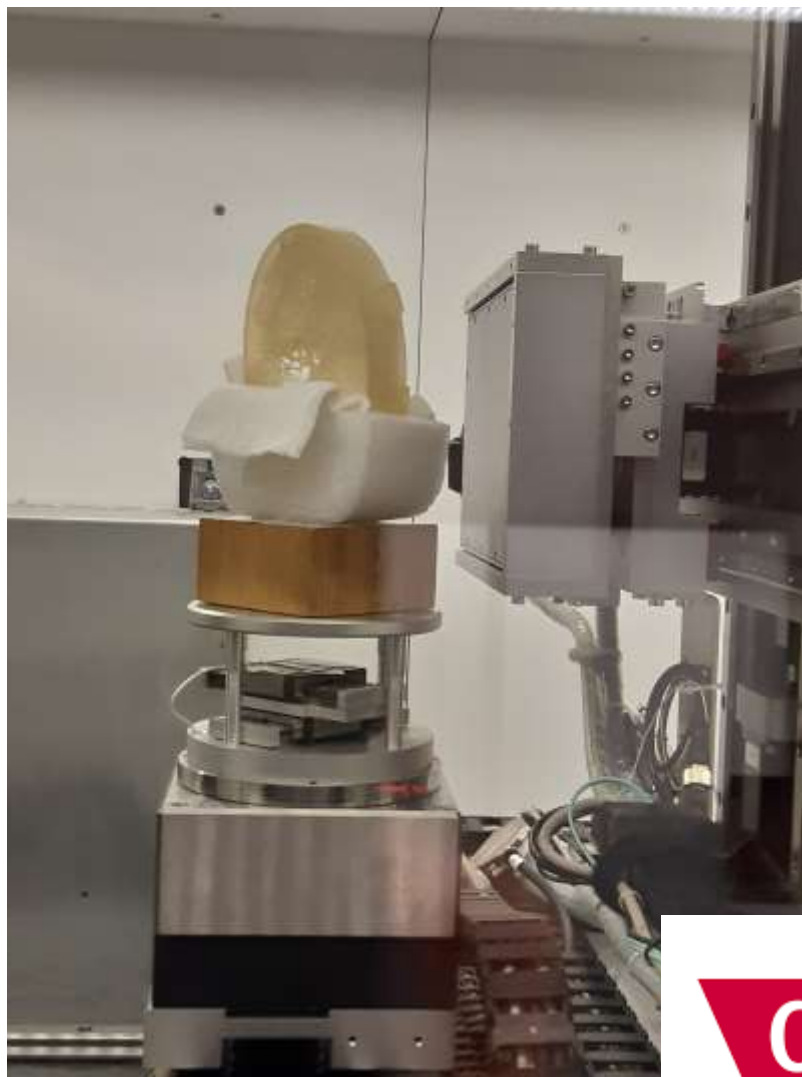


Flex Ray Lab



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# Micro-CT imaging

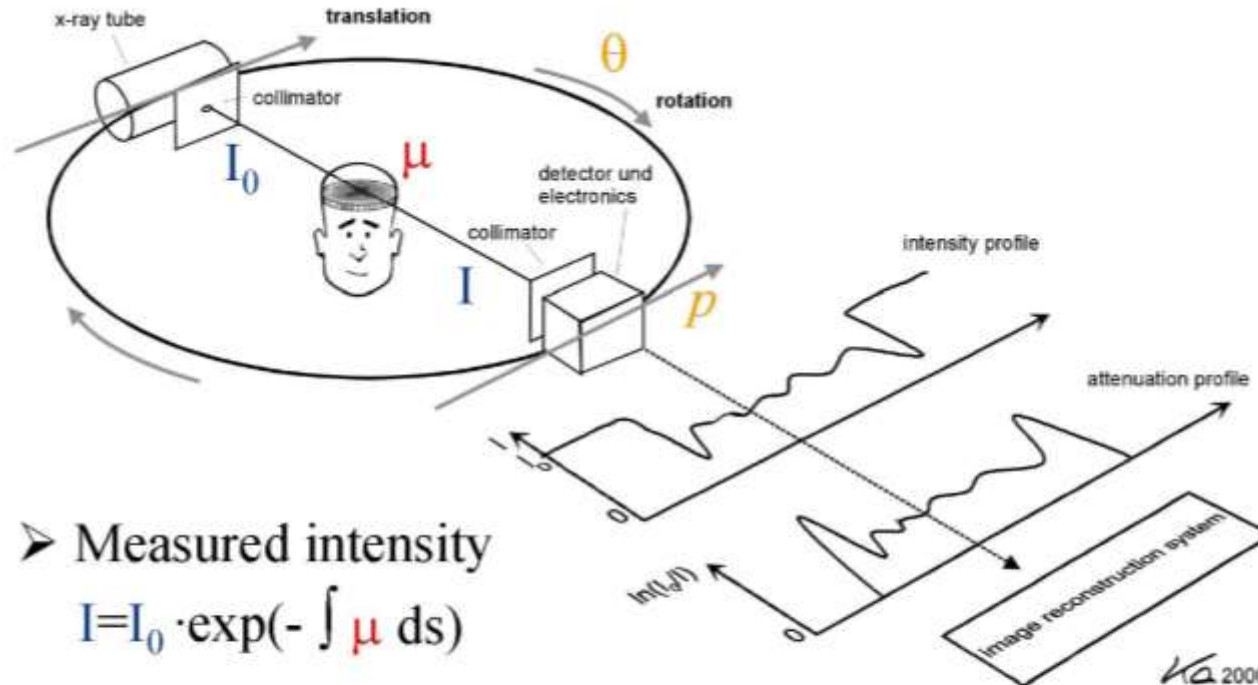


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# Computed Tomography



- Measured intensity

$$I = I_0 \cdot \exp\left(-\int \mu \, ds\right)$$

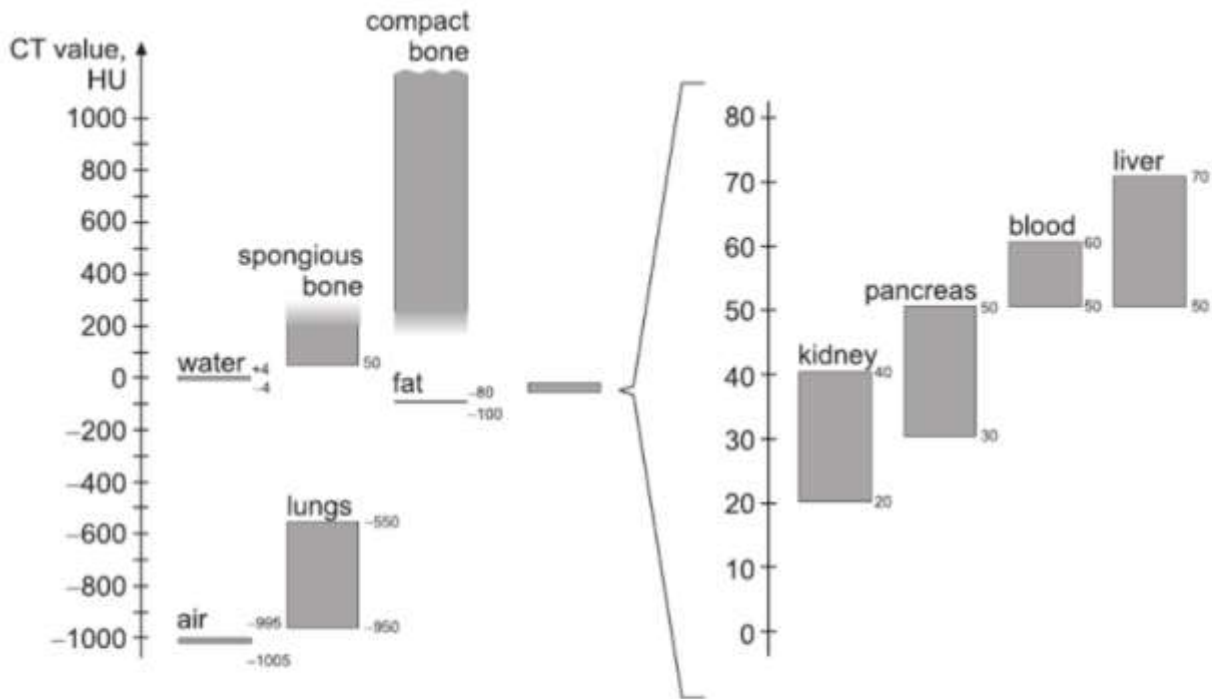
- Total attenuation (line integral)

$$f_{\theta}(p) = \int \mu \, ds = -\ln(I/I_0)$$

↑  
Attenuation coefficient, CT value

“Computed Tomography: Fundamentals, system technology, image quality and applications”, W. A. Kalender 2011

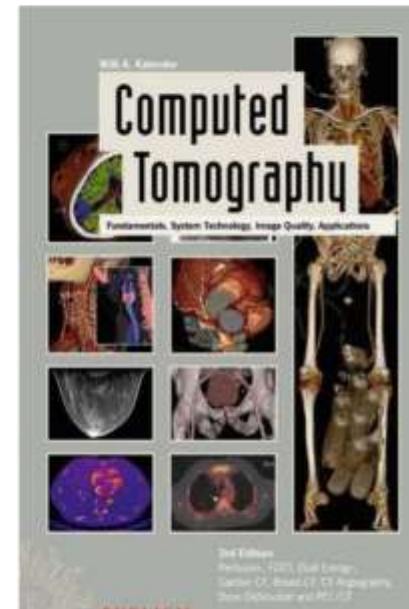
# What do the pixel values in CT represent?



**Figure 1.9**

The Hounsfield scale. CT values characterize the linear attenuation coefficient of the tissue in each volume element relative to the  $\mu$ -value of different tissues are therefore defined to be relative independent of the x-ray spectrum.

“Computed Tomography: Fundamentals, system technology, applications”  
W. A. Kalender 2011



CT values of the same material depend on X-ray spectrum energy → kV dependence



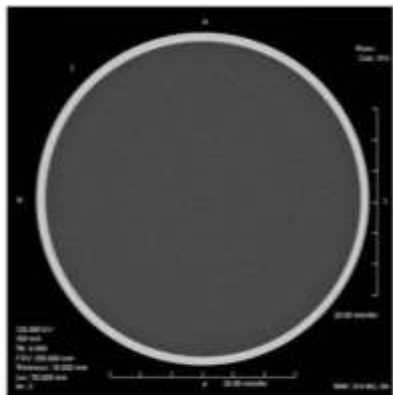
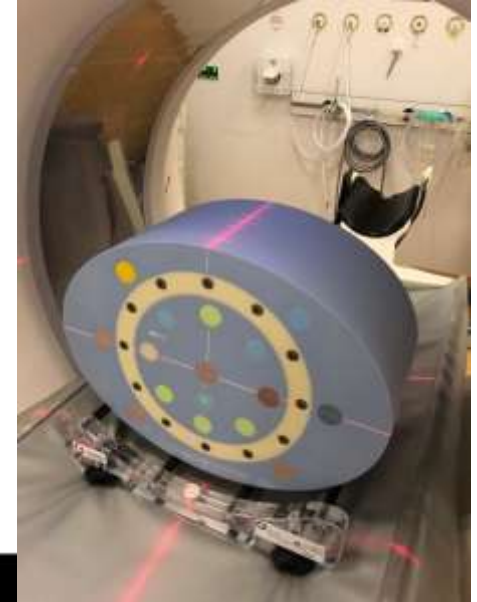
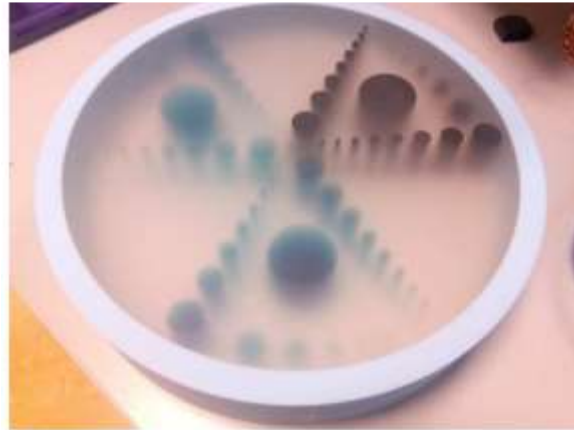
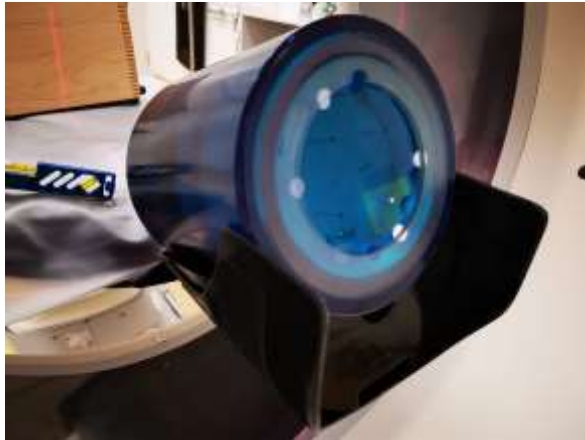
# Some differences between medical CT and micro-CT

- The main target in medical CT is imaging human body. The system is calibrated for a range of materials attenuations (in general between air (low attenuation) and high dense bone (high attenuation)).
- FOV can be adapted to patient size and scanned body part
- kV range between 80-140 kV
- Existing inherent filtration (bow tie filter or shape filters), depending on the target body part
- Tube current varies depending of indication but it is at least of the order of tens mAs (Ex. 200mAs)
- Table moves at the same time as X-ray tube rotates (in general)
- Different resolution in XY and Z. Z direction resolution threshold around detector element size (around 0.5mm or 0.25 mm for UHR systems)

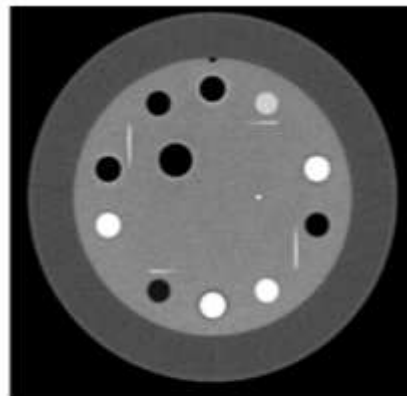
- Micro-CT imaging can have targets of all sorts and compositions: insects, minerals, tissue samples, industrial applications...
- In general for small objects or need for image stitching
- kV range between 20kV up to 100kV (50kV is usual)
- Usually no filtration, though it can be added, to absorb low energy photons that increase noise
- Tube current in the order of 500-1000 $\mu$ A
- Only X-ray tube rotates around sample
- Resolution of order of  $\mu$ m (0.001 mm)

# IQ assessment in Radiology (Physics)

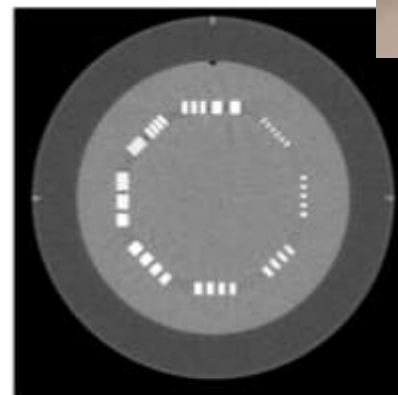
## Geometric phantoms



Noise



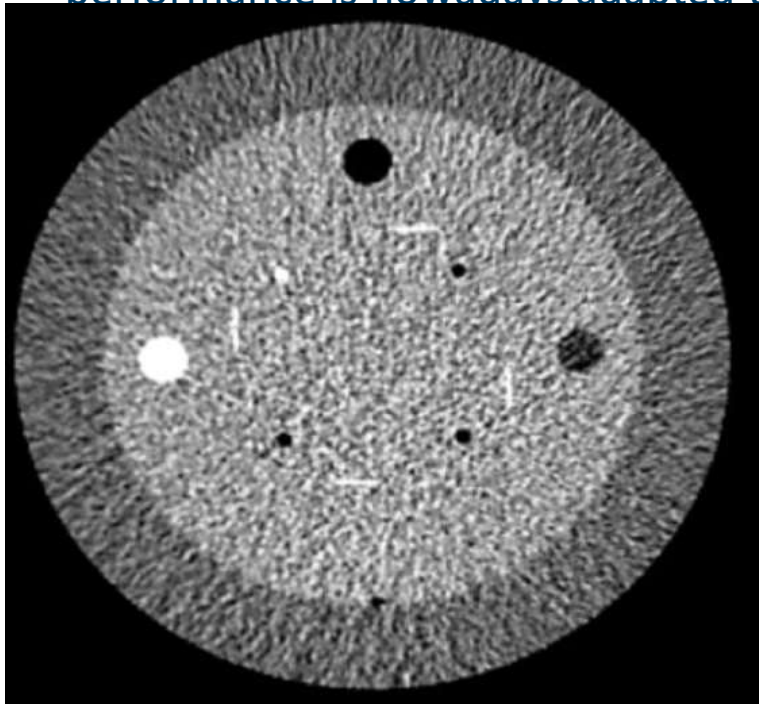
CT numbers consistency:  
Hounsfield Units (HU)



Spatial resolution:  
Line-pairs pattern

# Geometric phantoms for IQ assessment in Radiology: limitations

- The most used phantoms to assess image quality, do not reproduce the shape nor the anatomy of the patient
- Most of this phantoms are meant to analyze aspects of image quality in 2D but lesions or anatomy is in 3D.
- Medical imaging systems become progressively more complicated and their performance is nowadays adapted to having in the scanner a human



→ X-ray tube out  
etry of the object  
and specially DL-  
(ent data) are des

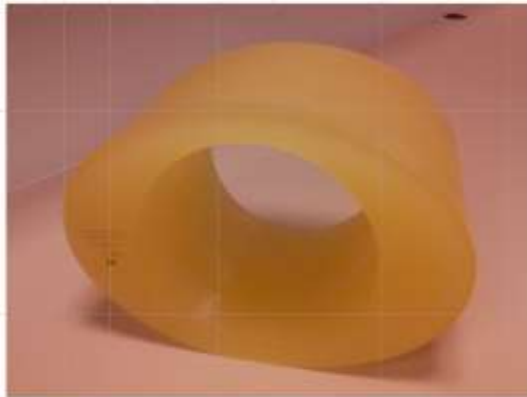


to analyze the pe  
if they are within  
ality metrics. BUT.



# Anthropomorphic phantoms: accesories for geometric phantoms

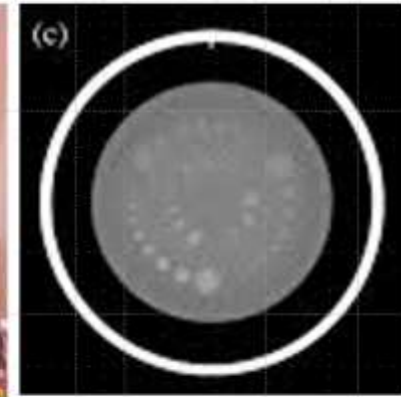
- To mimic the shape and attenuation of the head and body of the patient, some phantoms have rings (sold separately).



Thorax-shaped ring

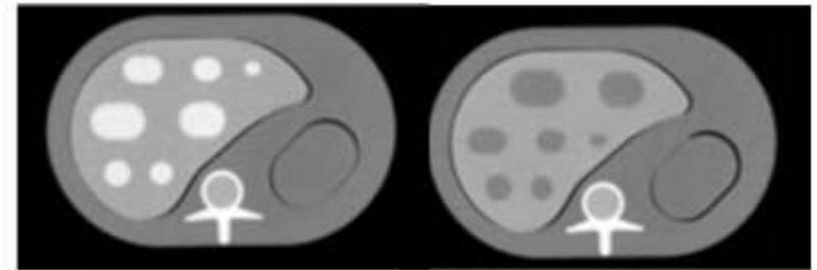
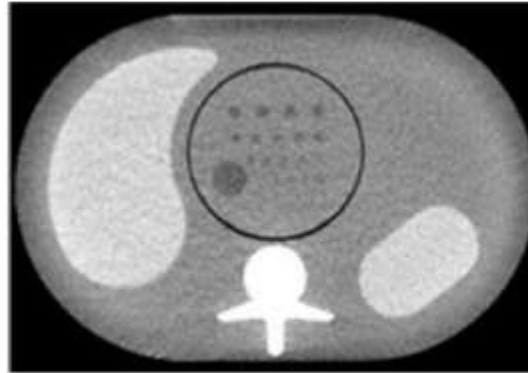


Abdominal rings



Teflon ring  
(skull attenuation)

# Anthropomorphic phantoms: accesories for geometric phantoms

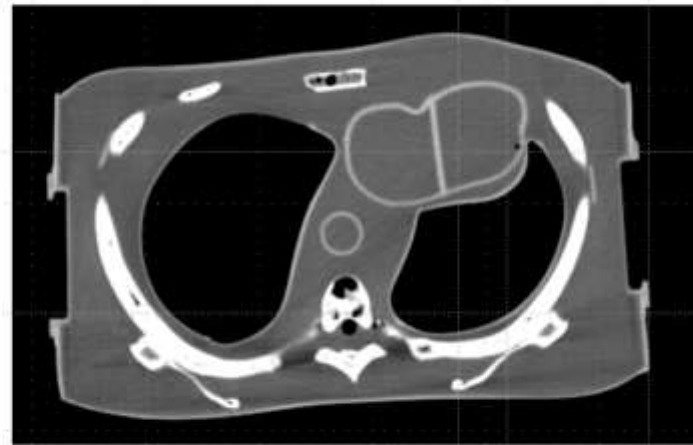
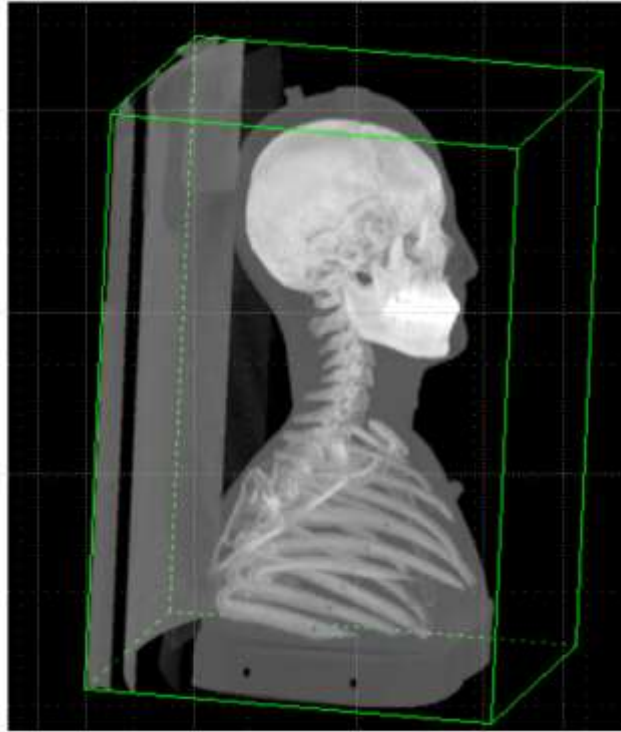


<http://www.qrm.de/content/pdf/QRM-3DLC.pdf>

[http://www.qrm.de/content/products/anthropomorphic/extension\\_rings.htm](http://www.qrm.de/content/products/anthropomorphic/extension_rings.htm)

[http://www.qrm.de/content/products/anthropomorphic/liver\\_phantom.htm](http://www.qrm.de/content/products/anthropomorphic/liver_phantom.htm)

# Anthropomorphic phantoms



Usually organs are cast on one material each, and no tissue texture or complexity

# Anthropomorphic phantoms

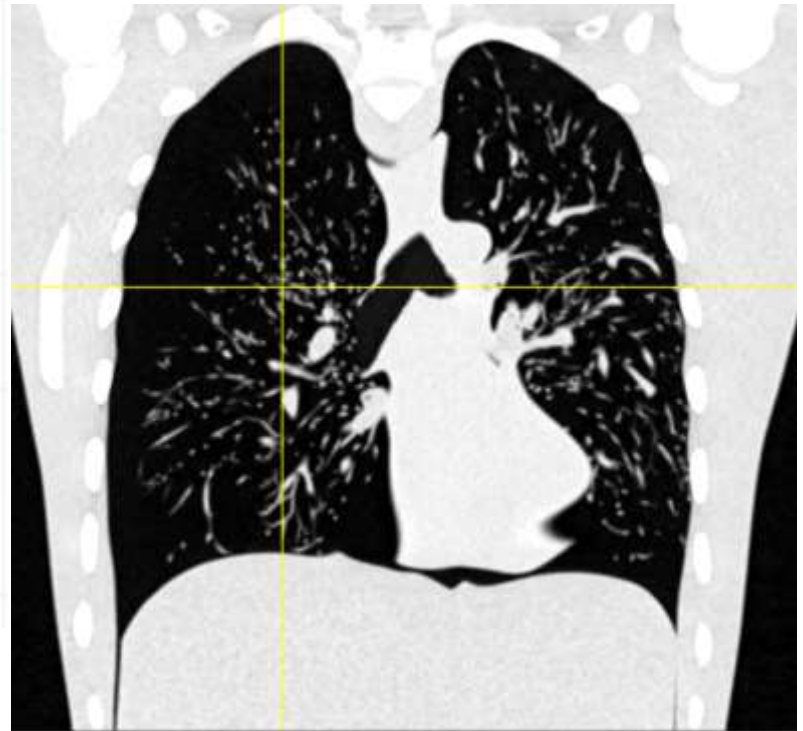
Kyoto Kagaku  
CTU41 Torso  
phantom



Kyoto Kagaku  
Pediatric phantom



<https://www.kyotokagaku.com/products/detail03/ph-4.html>

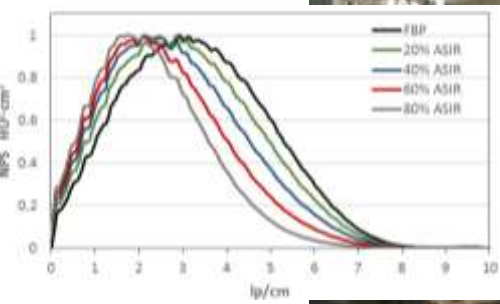
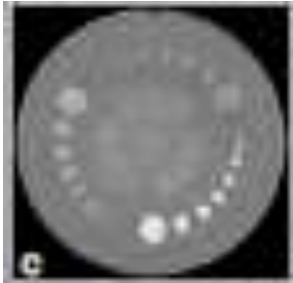
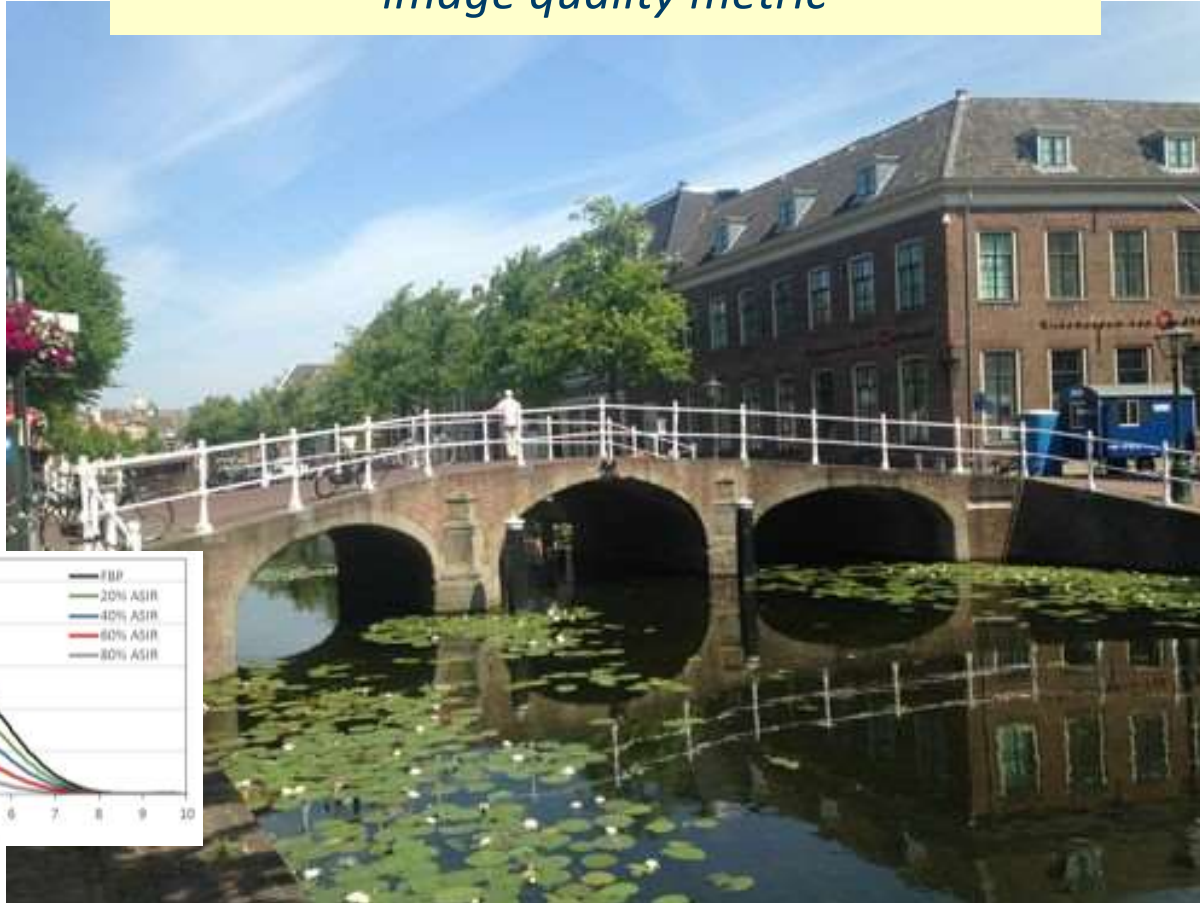


CT images courtesy of Dr.  
Marcel Greuter

# TASK-BASED

*We need to define:  
Clinically relevant tasks that can be translated into an objective measurement/  
image quality metric*

Physicists



Radiologists



CAD/AI



**We need anthropomorphic phantoms that mimic tissue attenuation, anatomical distribution and patient total attenuation and shape, containing relevant lesion surrogates.**





3D PRINTING

# 3D printing origins



**Charles Hull**  
**Inventor of Stereolithography (SLA)~ 1980s**  
**Co-founder of 3D systems**

- Problem: How to prototype plastic parts to be used for injection molds? Tedious, manual process, errors in the molds...
- He also worked in a company that gave UV-cured plastic coatings to materials (furniture) layer by layer
- If you can put many of these plastic layers together, you can create a pure plastic part!  
→ Stereolithography (SLA)

[Video with Chuck Hull](#)

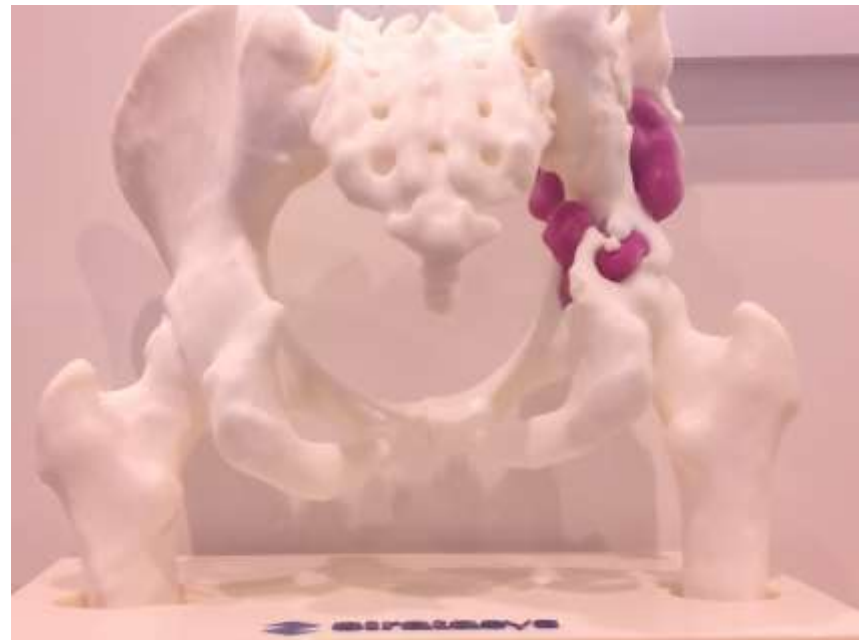
<https://www.youtube.com/watch?v=yQMJAg45gFE>

[Photo from:](#)

<https://www.epo.org/learning-events/european-inventor/finalists/2014/hull.html>

# 3D printing in Medicine: State of the art

## Surgery/Treatment planning



# 3D printing in Medicine: State of the art

## Training/demo of normal/pathological anatomy



# 3D printing in Medicine: State of the art

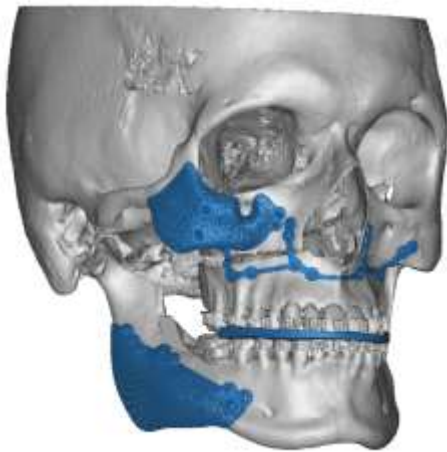
## Prosthesis/medical devices

**ISO 13485:2016**

[Preview](#)

Medical devices -- Quality management systems -- Requirements for regulatory purposes

ISO 13485:2016 specifies requirements for a quality management system where an organization needs to demonstrate its ability to provide medical devices and related services that consistently meet customer and applicable regulatory requirements. Such organizations can be involved in one or more stages of the life-cycle, including design and development, production, storage and distribution, installation, or servicing of a medical device and design and development or provision of associated activities (e.g. technical



nature > scientific reports > articles > article

SCIENTIFIC REPORTS

Article | OPEN | Published: 27 November 2014

### Fabrication of low cost soft tissue prostheses with the desktop 3D printer

Yong He , Guang-huai Xue & Jian-zhong Fu 

Scientific Reports 4, Article number: 6973 (2014) | [Download Citation](#) 

<https://www.materialise.com/en/blog/from-superhero-mask-to-new-face-and-new-life-thanks-to-3d-printed-cmf-implants>

<https://www.iso.org/standard/59752.html>

# 3D printing in Medicine: State of the art

## Prosthesis/medical devices



<https://www.oceanz.eu/en/about/business-cases/medisch-3d-printen-een-prothesekoker>



<http://enablingthefuture.org/>

3D printing has a great potential in applications for prosthesis for children/adults due to the relative low cost and customization options:

- Enables to replace prosthesis as the child grows
- Increasing access to prosthesis in developing or in conflict countries

# 3D printing in Medical imaging

## Phantoms for image quality

- Based on patient CT images



- Based on models reproducing patient anatomical structures



Solomon et al 2014  
printed lung phantom  
containing nodules




Phantom sample courtesy of  
Paul Jahnke (PhantomX,  
<https://phantomx.de/>)

Solomon J, Samei E. Quantum noise  
reconstruction algorithms: FBP and

red backgrounds across

## MEDICAL PHYSICS

The International Journal of Medical Physics Research and Practice

Review Article |  Open Access |  

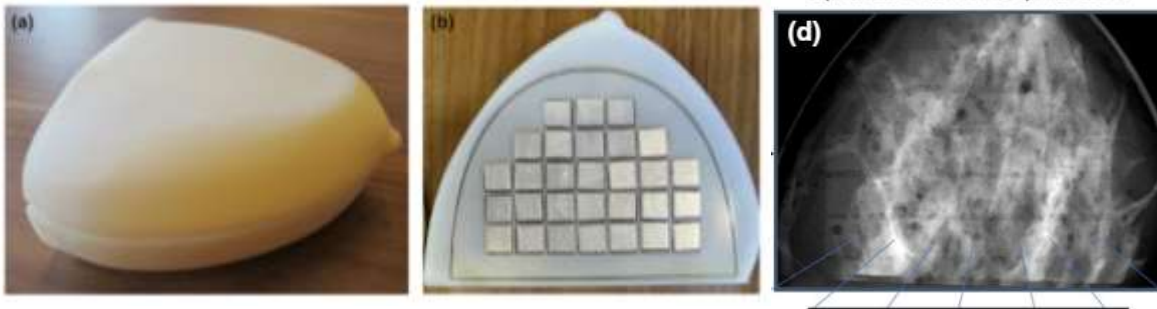
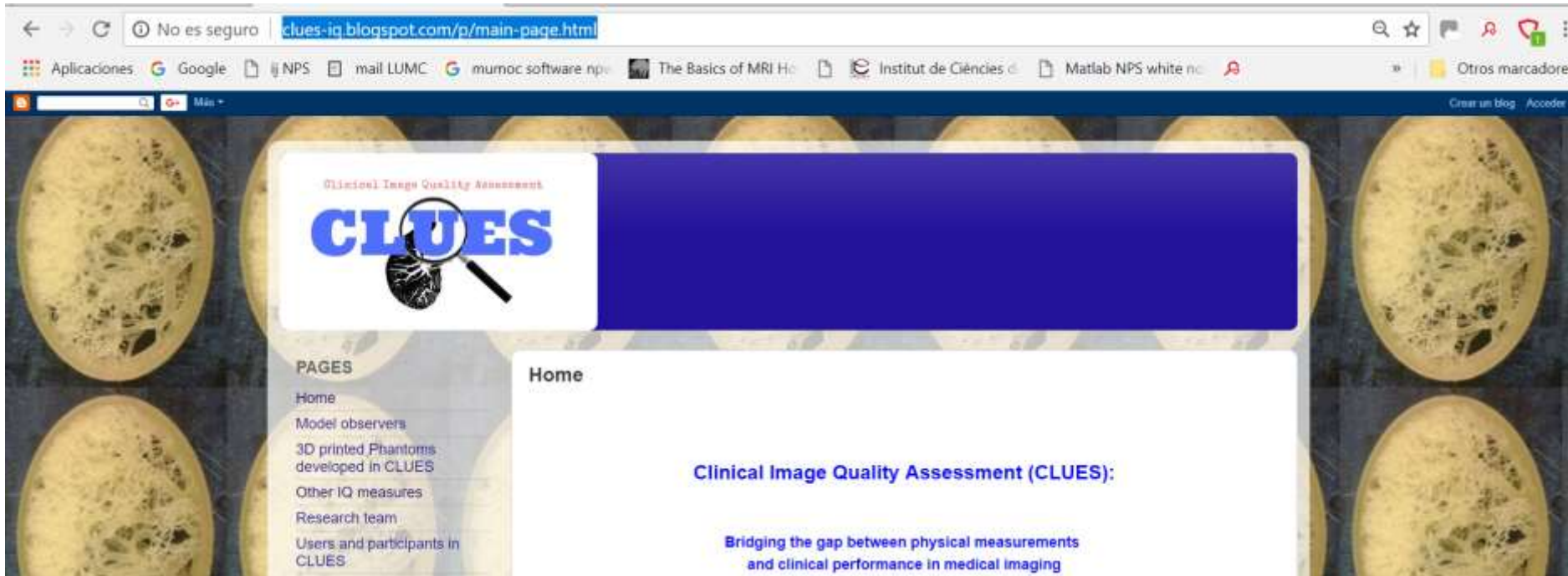
### Recent advances on the development of phantoms using 3D printing for imaging with CT, MRI, PET, SPECT, and ultrasound

Valeria Filippou, Charalampos Tsoumpas 

First published: 22 June 2018 | <https://doi.org/10.1002/mp.13058> | Citations: 105



# CLUES Project (2015-2019)



Balta et al. A model observer study using acquired mammographic images of an anthropomorphic breast phantom  
*Med Phys* 2018;45(2):655-665

<http://clues-iq.blogspot.com/p/main-page.html>

NWO- Veni Talent Scheme Programa Project (Jan 2020-Jan 2023):  
**Through the eyes of AI:**  
**safe and optimal integration of artificial intelligence in radiology**

## Radiologists



Development of anthropomorphic test objects as patient surrogates, with a known ground truth to evaluate the effect of acquisition and reconstruction parameters on CAD/AI performance in CT

## CAD/AI



# Goal

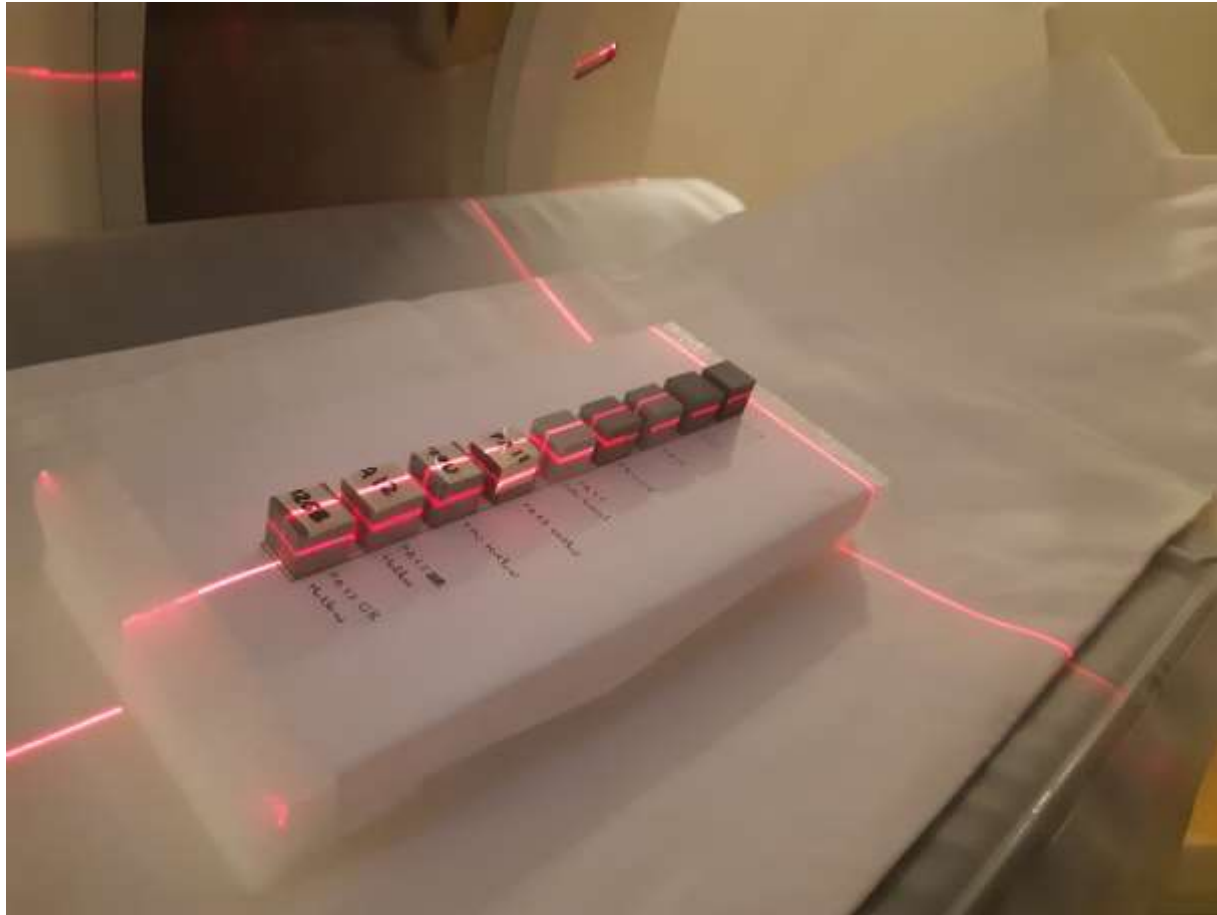
- We wanted an anthropomorphic phantom for CT image quality assessment that was portable and designed for specific diagnostic tasks.
- We looked into CT thorax imaging
- Lung vessel detection and quantification is used to determine patient diagnosis and disease stage and evolution
- These diagnostic tasks are performed by humans (segmenting CT images by hand) or with automatic algorithms
- Having a test object where the ground truth is known (custom model) can help to determine the influence of different acquisition and reconstruction parameters in image quality, in particular their effect in vessel quantification.
- Such phantom can be used for QA of CT systems, comparison and benchmark of CT protocols and systems...
- Such a phantom could be combined with inserted lesions as surrogates for lung nodules

# 3D printed anthropomorphic phantoms for CT

## Checklist and things to think about:

- The materials need to mimic to some extent the X-ray attenuation of the target tissues
- Metals are usually forbidden (unless in small quantity and in powder form, to increase attenuation and not produce artifacts or to test metal artifact influence on IQ)
- Multimaterial printing still needs development
- Image quality phantoms is very niche in 3D printing, usually regular providers do not know about it. Problems with finishing methods, for instance can arise
- 3d printing materials are plastic based, the same commercial name for a plastic does not necessarily mean that the HU in CT will be the expected

# Evaluation of attenuation of 3D printing materials in CT imaging







Measure pixel value in ROIs over several images, averaged between several scans, for each material. Try to match, HU values in tissues to potential 3D printing materials candidates

ORIGINAL RESEARCH article

Front. Bioeng. Biotechnol., 29 November 2021 | <https://doi.org/10.3389/fbioe.2021.763960>



## Classification of X-Ray Attenuation Properties of Additive Manufacturing and 3D Printing Materials Using Computed Tomography From 70 to 140 kVp

 Xiangjie Ma<sup>1</sup>,  Martin Buschmann<sup>2</sup>,  Ewald Unger<sup>1</sup> and  Peter Homolka<sup>1\*</sup>

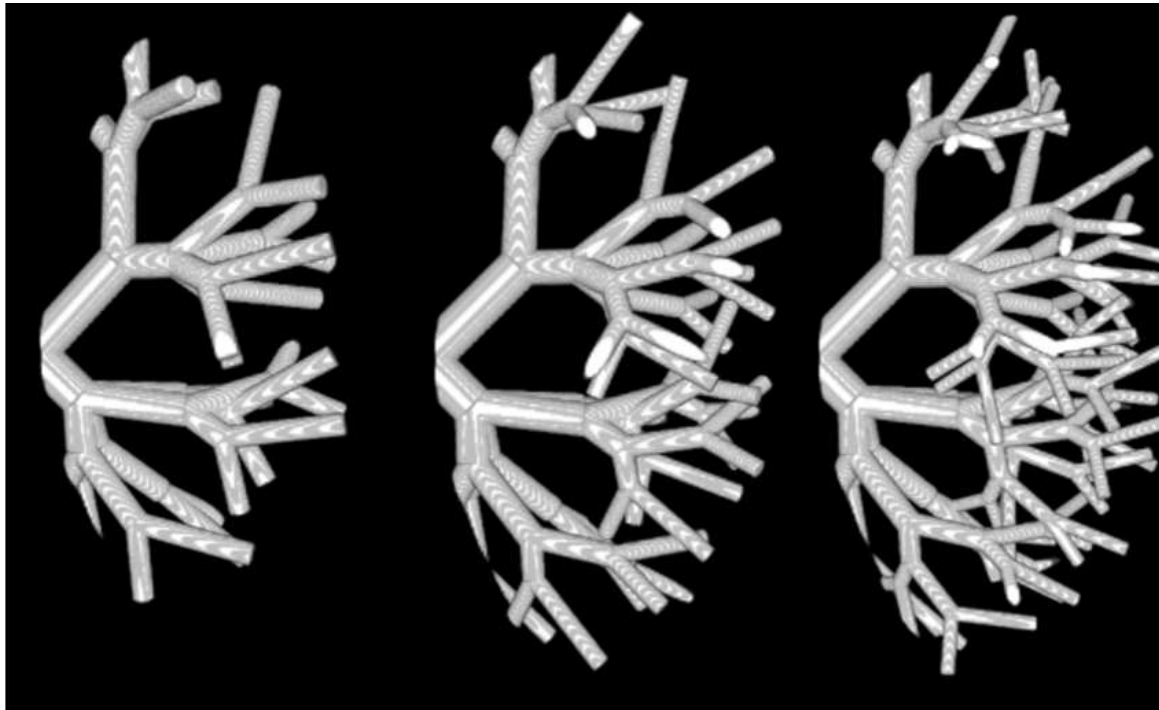
<sup>1</sup>Center for Medical Physics and Biomedical Engineering, Medical University of Vienna, Vienna, Austria

<sup>2</sup>Division of Medical Radiation Physics, Department of Radiation Oncology, Medical University of Vienna, Vienna, Austria

Some companies provide sample material kits that you can scan to find out potential tissue equivalents. Otherwise, create a simple and small model (cube 2x2x2cm) as test.

<https://www.frontiersin.org/articles/10.3389/fbioe.2021.763960/full>

# Lung vessel model



14 generations of vessels, diameters down to 0.2 mm, ~20000 vessels

Weibel ER. What makes a good lung? *Swiss Med Wkly* 2009;139 (27–28):375–386

Weibel ER, Gomez DM. Architecture of the human lung. Use of quantitative methods establishes fundamental relations between size and number of lung structures. *Science* 1962;137(3530):577-85.

# From model to 3D printed phantom



Lung vessel model



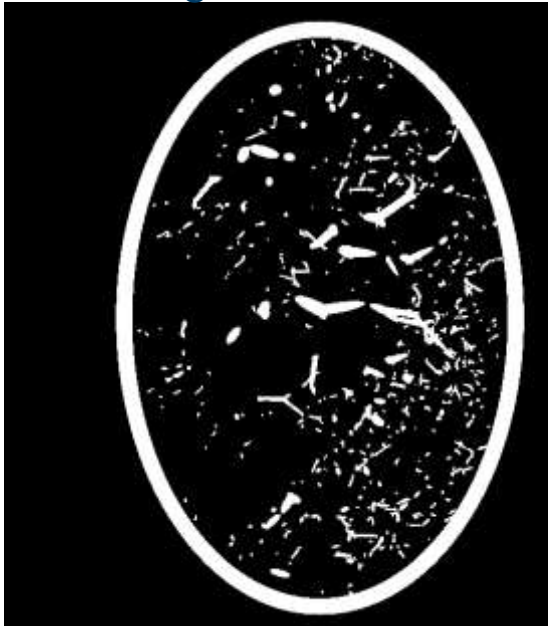
STL file



3D printer

## 3d printer

ProJet HD 3000  
MJM technique (UHD)  
32 $\mu$ m layer thickness  
Resolution 656x656x800 DPI



**Material:**  
Visijet EX200  
Density: 1.1 g·cm<sup>-3</sup>  
~105 HU@ 120 kV

**Smallest vessels:**  
0.2 mm diameter

**Phantom dimensions:**  
150x103x26 mm

Weibel ER. What makes a good lung? Swiss Med Wkly 2009;139 (27–28):375–386

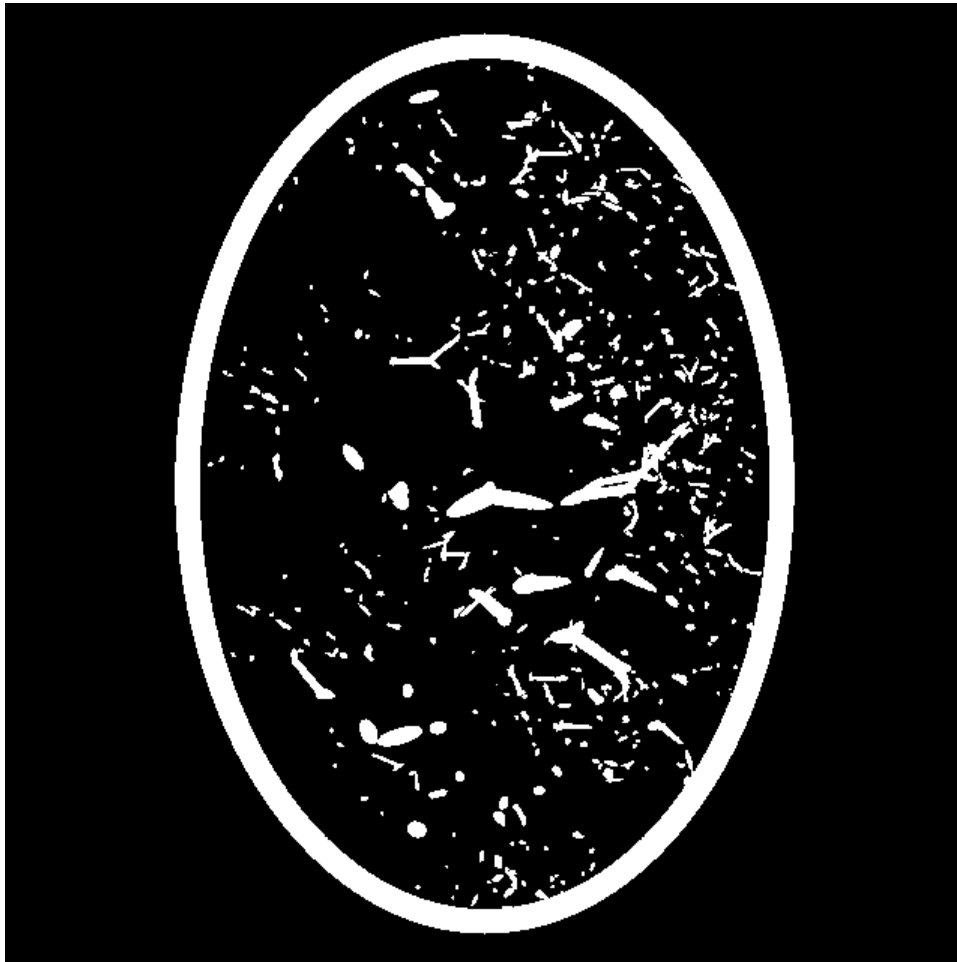
Weibel ER, Gomez DM. Architecture of the human lung. Use of quantitative methods establishes fundamental relations between size and number of lung structures. Science 1962;137(3530):577-85.

Initial lung vessel model software design by Dr. Chiel den Harder



# Mathematical lung vessel model

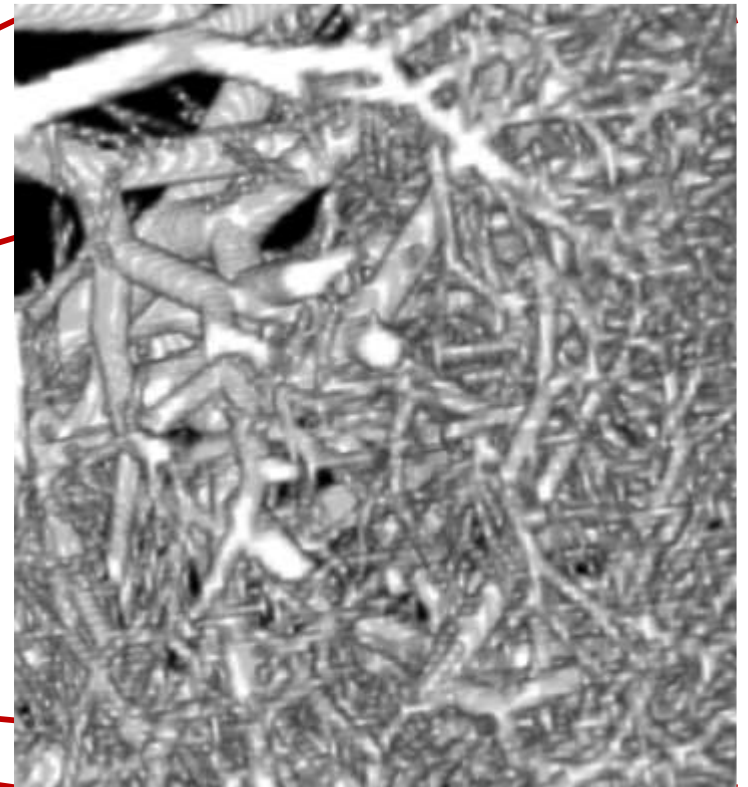
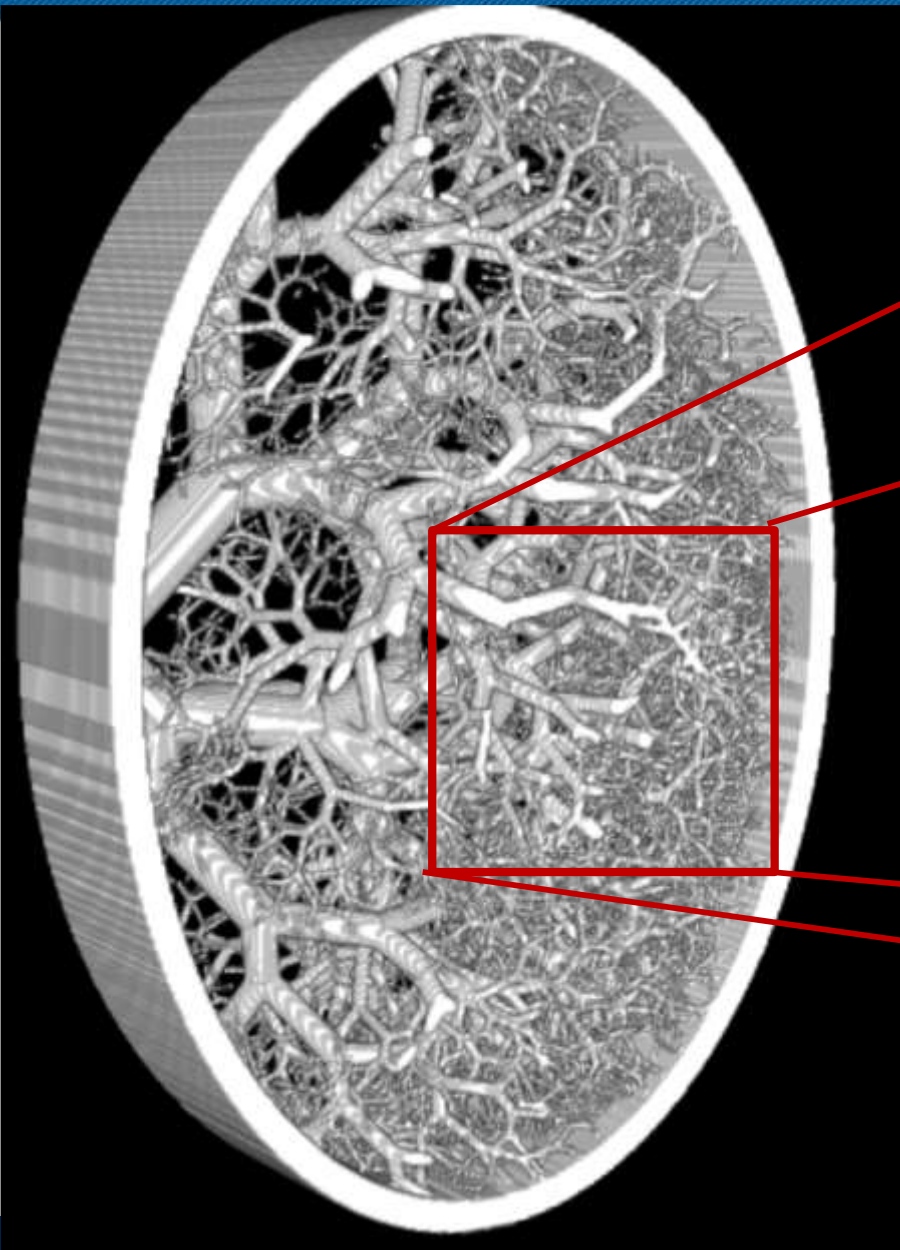
Mathematical model output

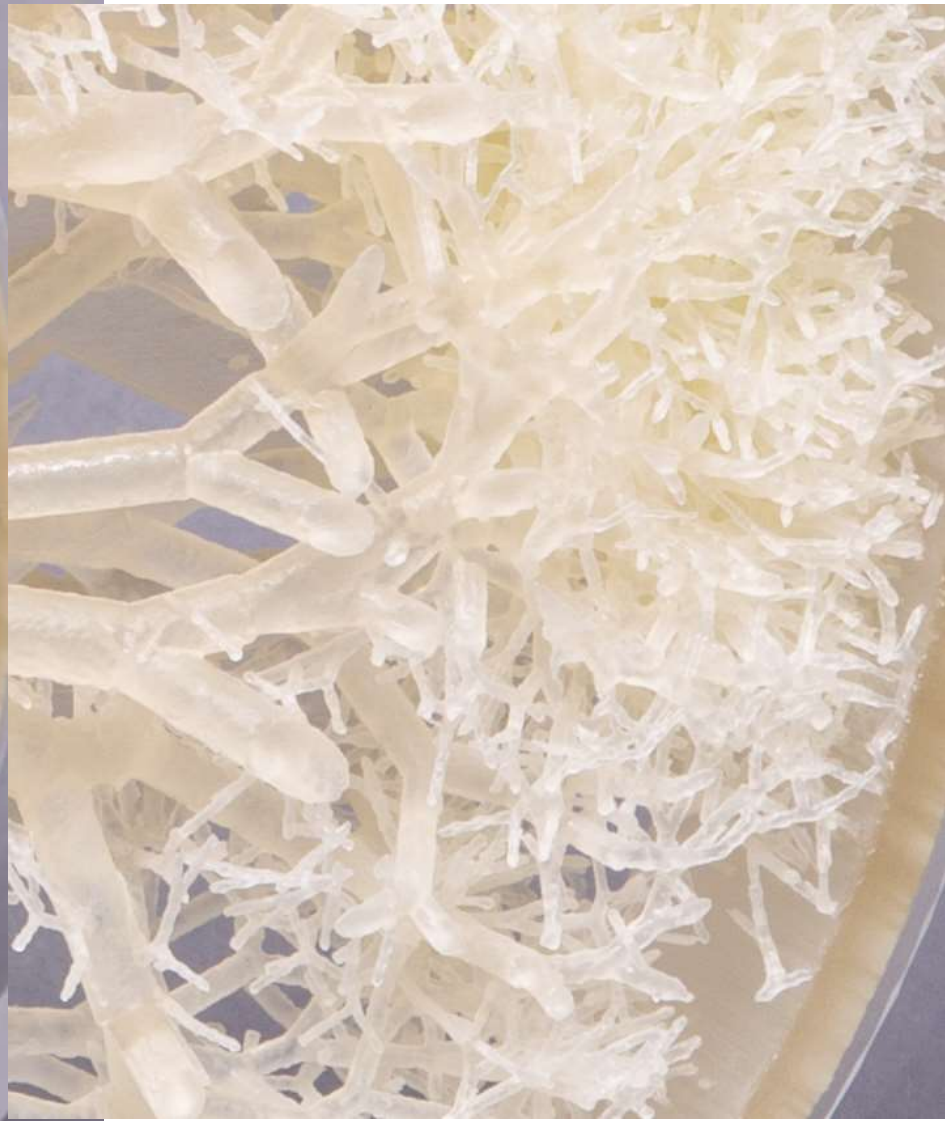
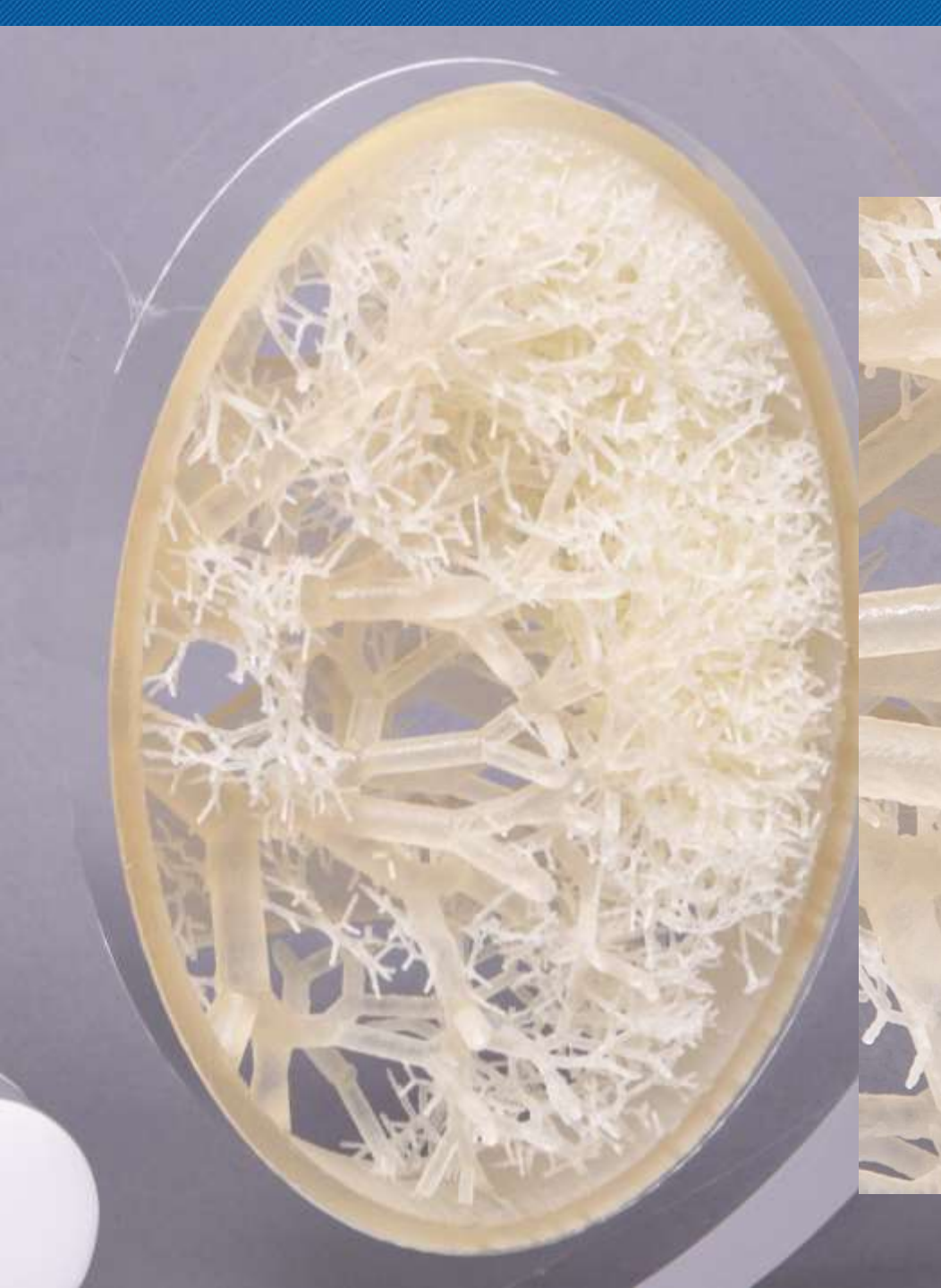


3D rendering



# Mathematical lung vessel model





# 3D printed lung vessel phantom



10x15x2.5 cm

Thorax-shaped holder



30x20x2.5 cm



Contents lists available at [ScienceDirect](#)

## Physica Medica

journal homepage: [www.elsevier.com/locate/ejmp](http://www.elsevier.com/locate/ejmp)



Original paper

### Development of a 3D printed anthropomorphic lung phantom for image quality assessment in CT

Irene Hernandez-Giron<sup>a,\*</sup>, Johan Michiel den Harder<sup>b</sup>, Geert J. Streekstra<sup>b</sup>, Jacob Geleijns<sup>a</sup>,  
Wouter J.H. Veldkamp<sup>a</sup>

<sup>a</sup> Radiology Department at the Leiden University Medical Center (LUMC), Leiden, The Netherlands

<sup>b</sup> Academic Medical Center (AMC), Amsterdam, The Netherlands



# Simulation of printing process different materials, same printer

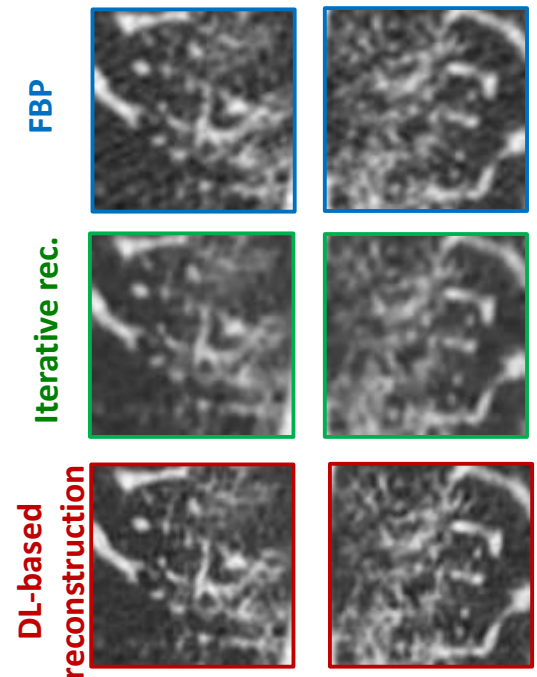
Strength test material 1



Strength test material 2



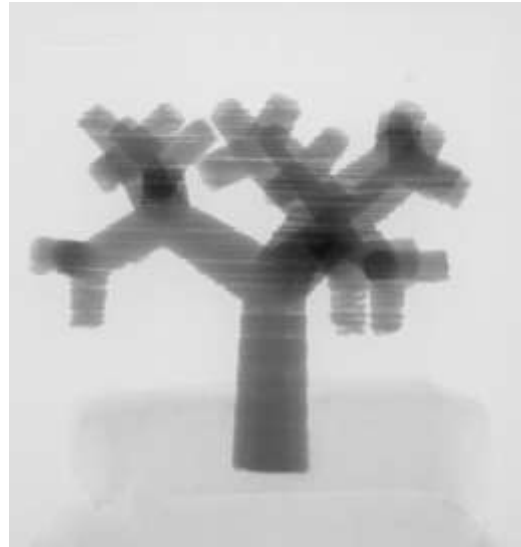
# Visual inspection: CT images



What is our phantom gold standard? Our design file? What changes can have happened between desing till printing?

# 3D printing pilot and micro-CT

Small fractal vessel tree, BCN stratos printer, PLA, 150 micros layers



Micro-CT projections  
50kV, 100 $\mu$ A, 1s, 2000  
projections

3D rendering based on micro-CT images



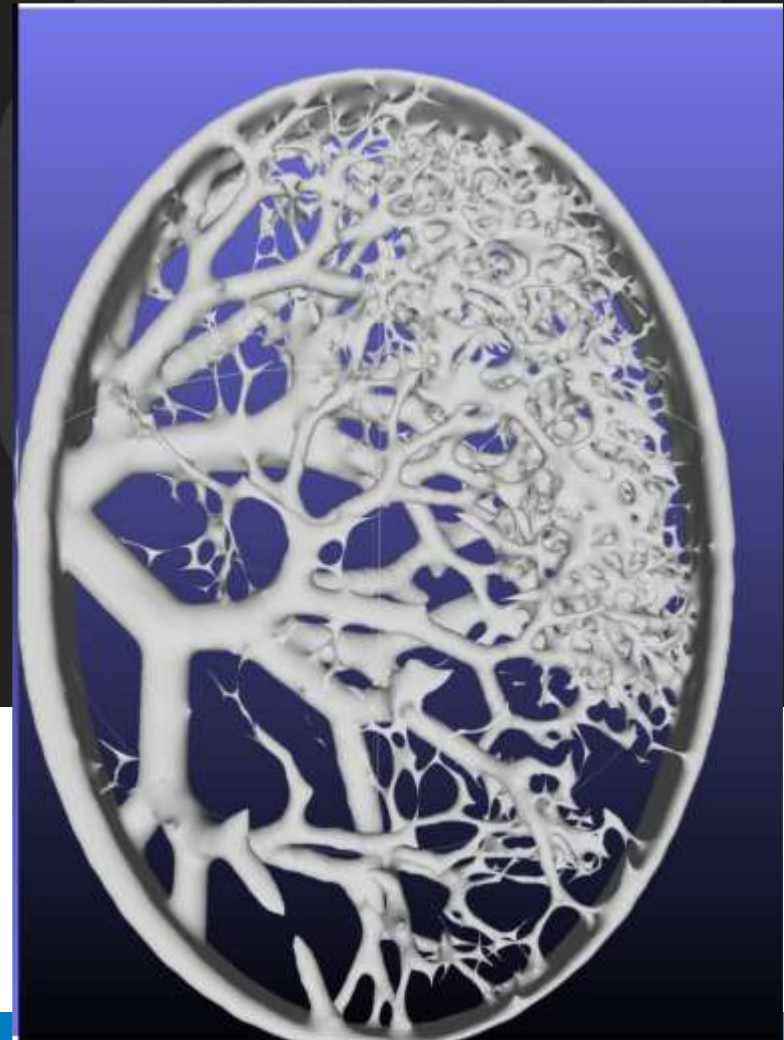
Cooperation with Dr. Chevalier, MsC Belarra and MsC student Sara de Scals, Universidad Complutense de Madrid (UCM)



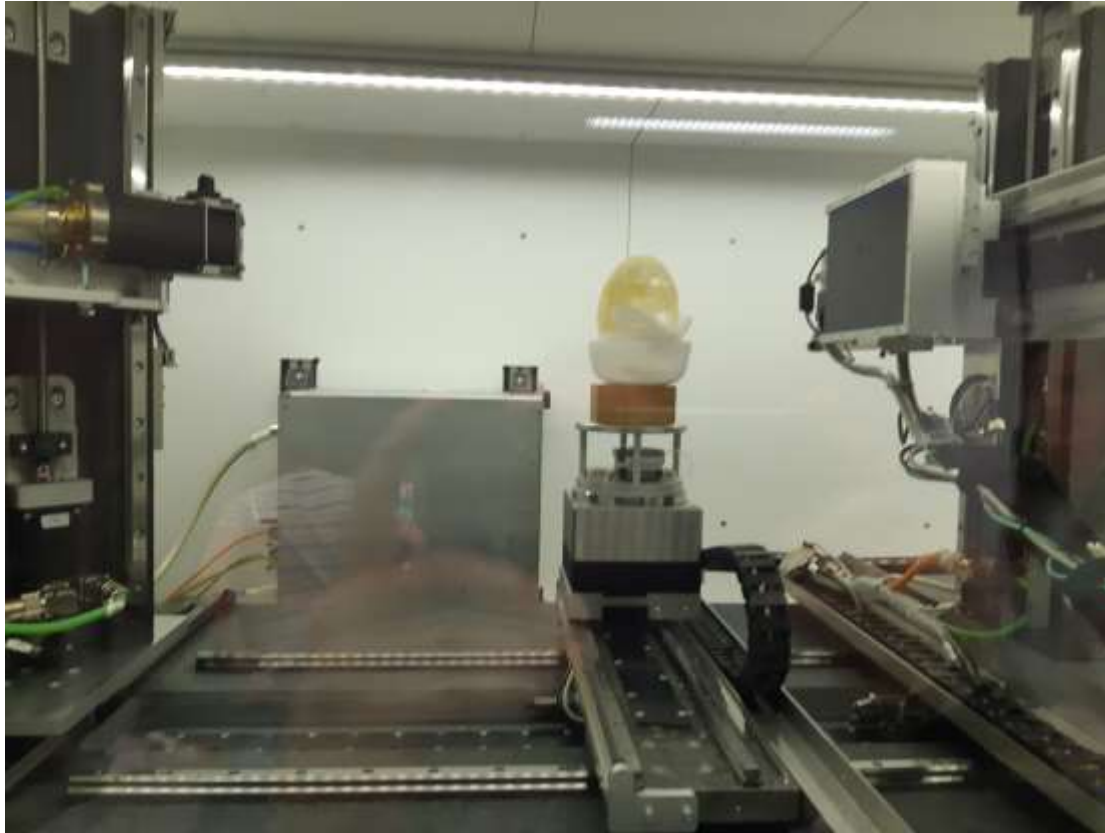
# Mathematical model (segmented by thresholding)



1mm slice thickness,  
0.6865mm/px



# Micro-CT imaging: Obtaining a gold standard for 3D printed object



Flex Ray Lab



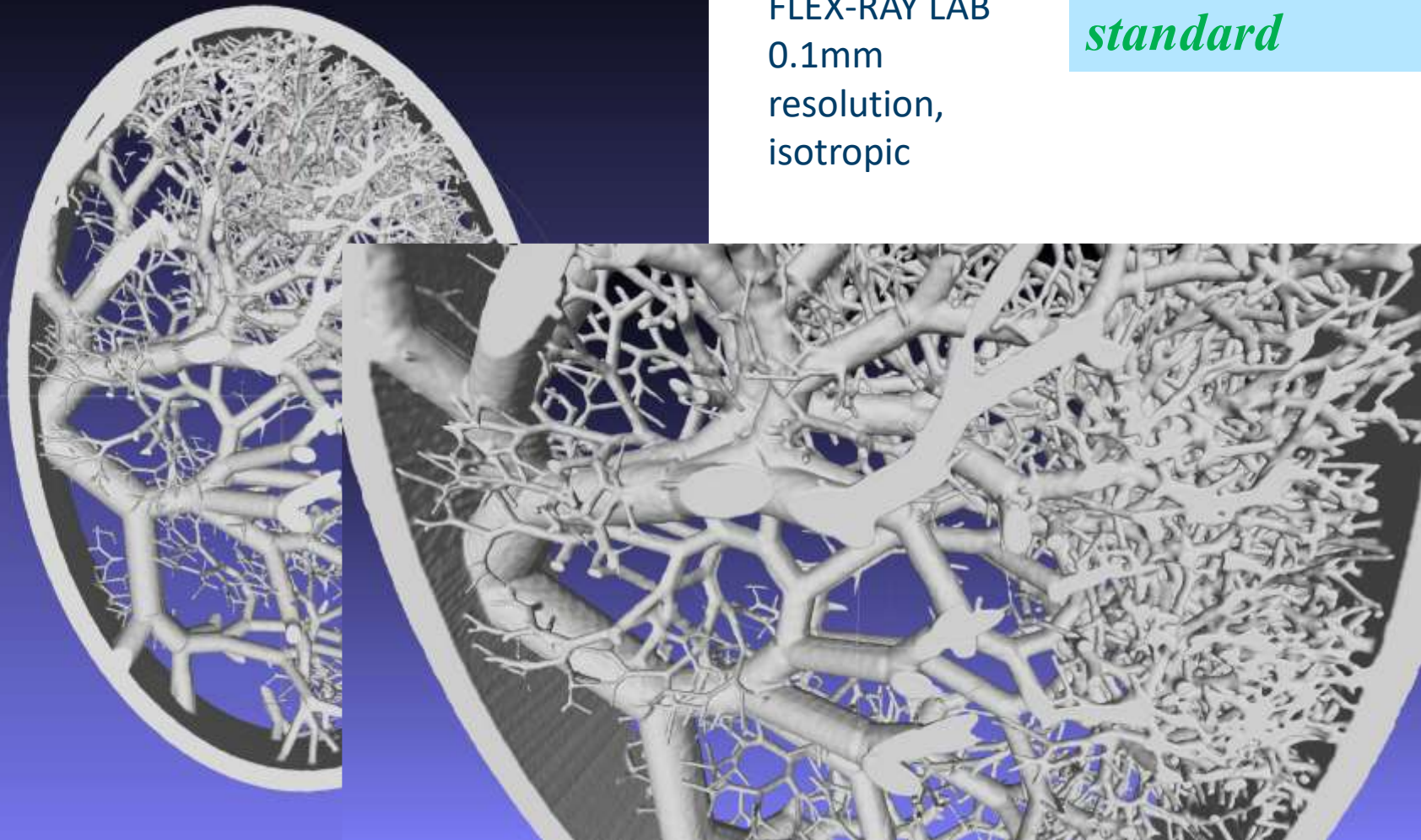
Centrum Wiskunde & Informatica

# Micro-CT (CWI)

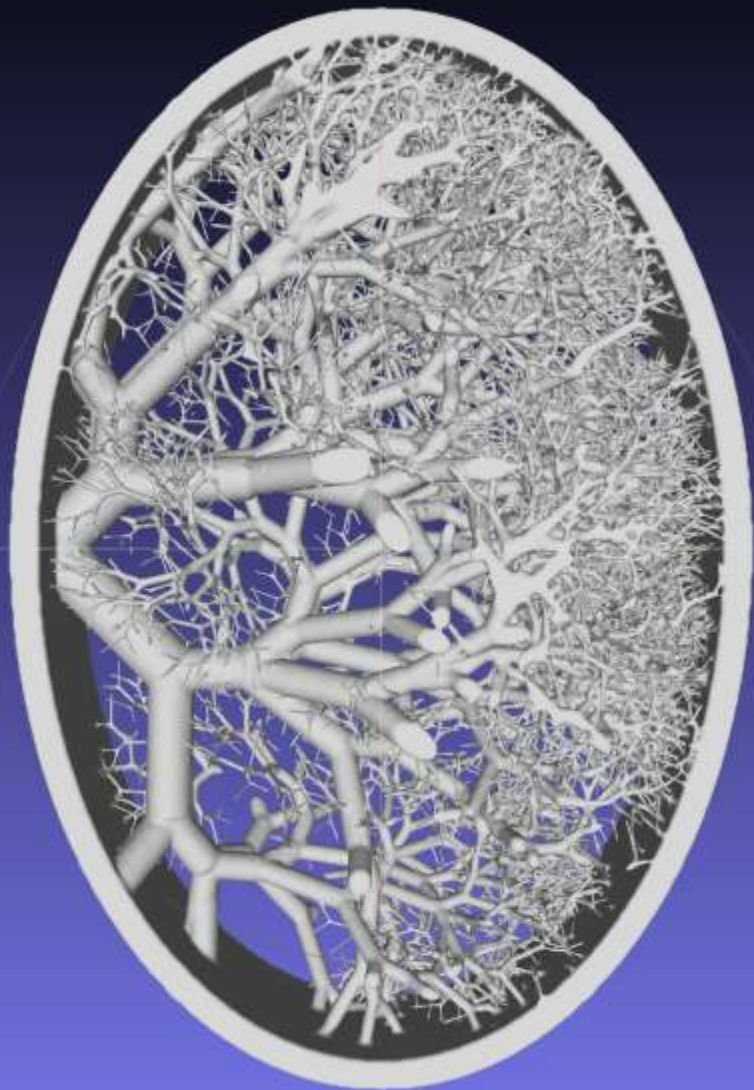
Images courtesy of Jan Matula and Felix Lucka, cooperation with Tristan van Leeuwen's group

Scanned in  
FLEX-RAY LAB  
0.1mm  
resolution,  
isotropic

Defining a *gold standard*



## Mathematical model



## MicroCT



PCCT, 0.2mm slice thickness  
0.3125mm/px

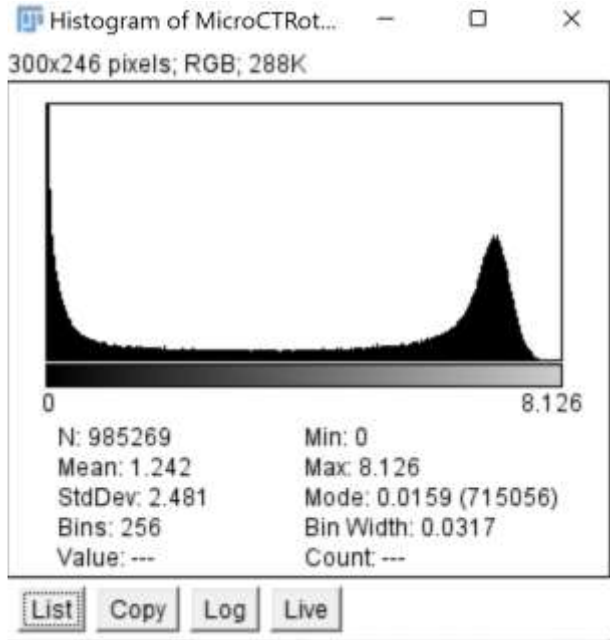
MicroCT, 0.1 mm slice thickness



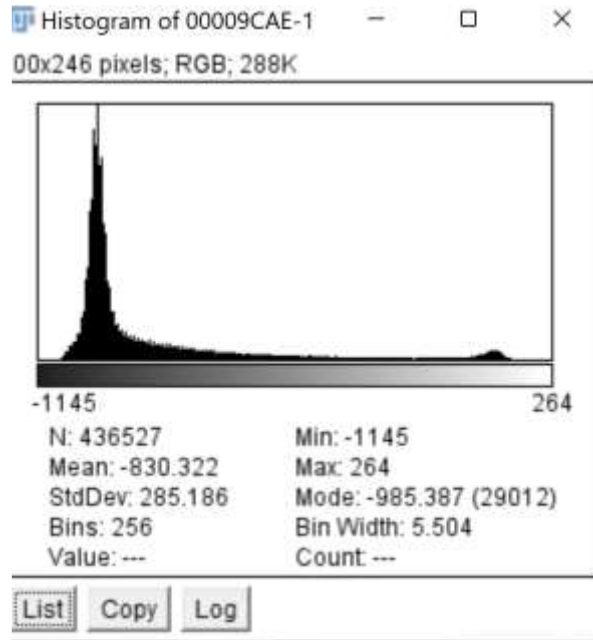
Cooperation with Erasmus MC, to be  
presented at ECR July 2022

# Pixel value (attenuation) quantification

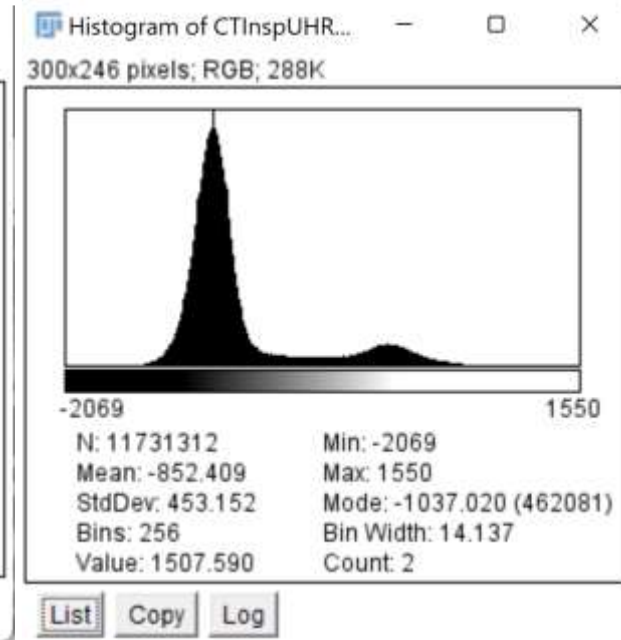
## MicroCT



## State of the art CT



## Photon Counting CT



- Different system filtration, different kV → Different X-ray spectrum and photon penetration
- This affects the range of different contrast values that can be visualized simultaneously

# Using micro-CT imaging for QC of 3d printed objects



MethodsX  
Volume 5, 2018, Pages 1102-1110



Method Article

## Standard method for microCT-based additive manufacturing quality control 1: Porosity analysis

Anton du Plessis <sup>a</sup>  , Philip Sperling <sup>b</sup>, Andre Beerlink <sup>b</sup>, Lerato Tshabalala <sup>c</sup>, Shaik Hoosain <sup>c</sup>, Ntombi Mathe <sup>c</sup>, Stephan G. le Roux <sup>a</sup>

 3D Printing and Additive Manufacturing > Vol. 5, No. 3 > Original Articles

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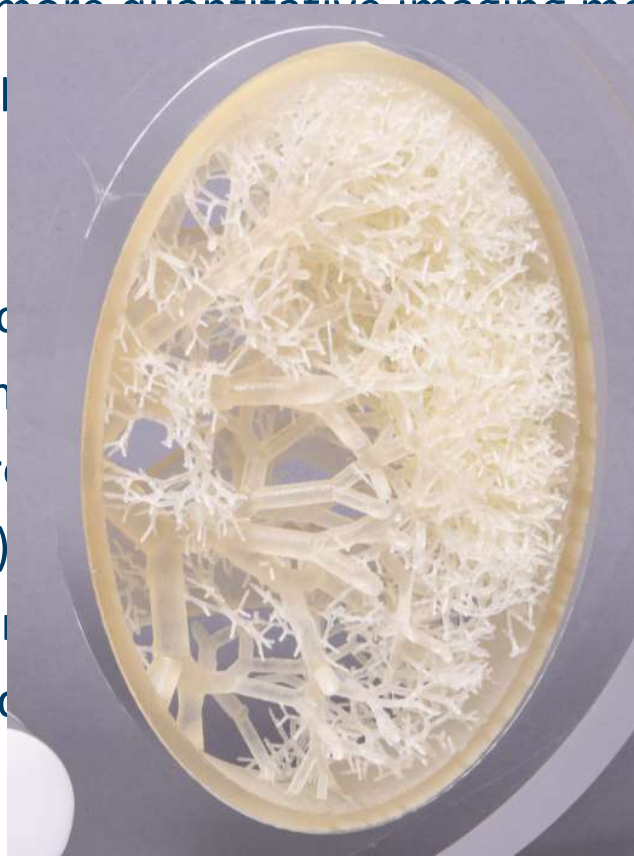
## X-Ray Microcomputed Tomography in Additive Manufacturing: A Review of the Current Technology and Applications

Anton du Plessis , Igor Yadroitsev, Ina Yadroitsava, and Stephan G. Le Roux

Published Online: 13 Sep 2018 | <https://doi.org/10.1089/3dp.2018.0060>

# Room for development for micro-CT imaging wrt phantoms characterization

- Making micro-CT a more quantitative imaging modality
- How to expand the range of contrast resolution for different materials
- Establishment of QC protocols for reconstruction of 3D printed objects (how many projections, reconstruction...)
- Methods to benchmark micro-CT images to micro-CT images (work in progress: image reconstruction parameters, SSIM, Haralick's texture parameters...)
- Optimization of micro-CT imaging parameters given time and results, depending on intended use



***Thank you, Bedankt, Gracias!***