

Development of breast tumours models database

Kristina Bliznakova

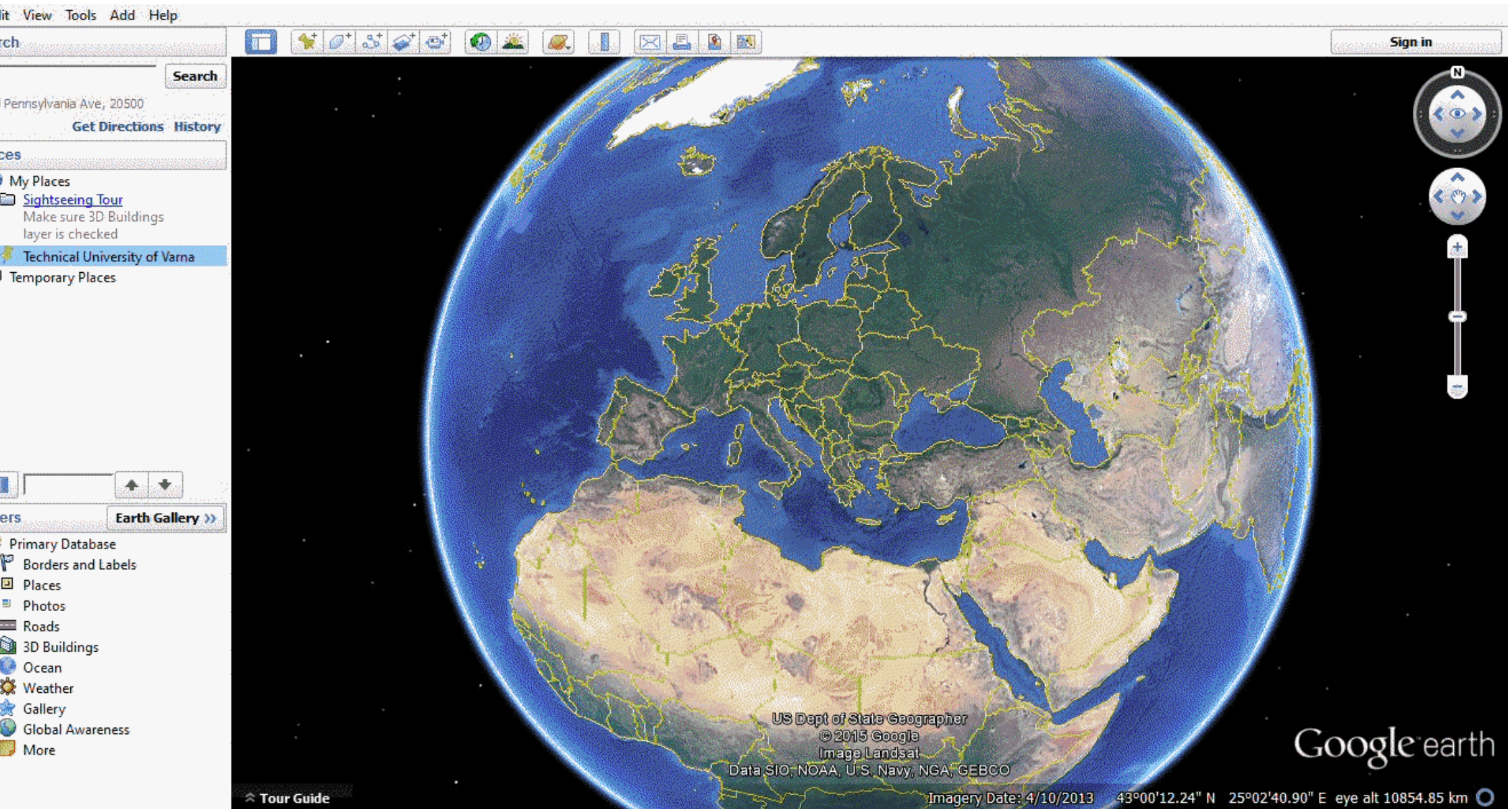
Laboratory of Computer Simulations in Medicine



Maxima team



location 😊

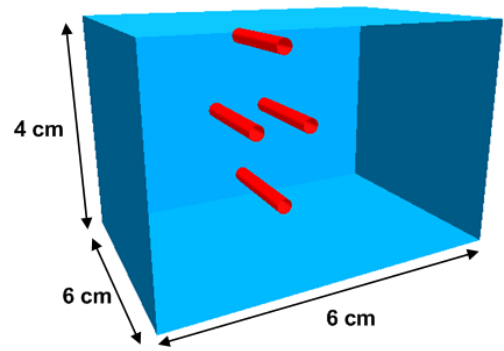


The place



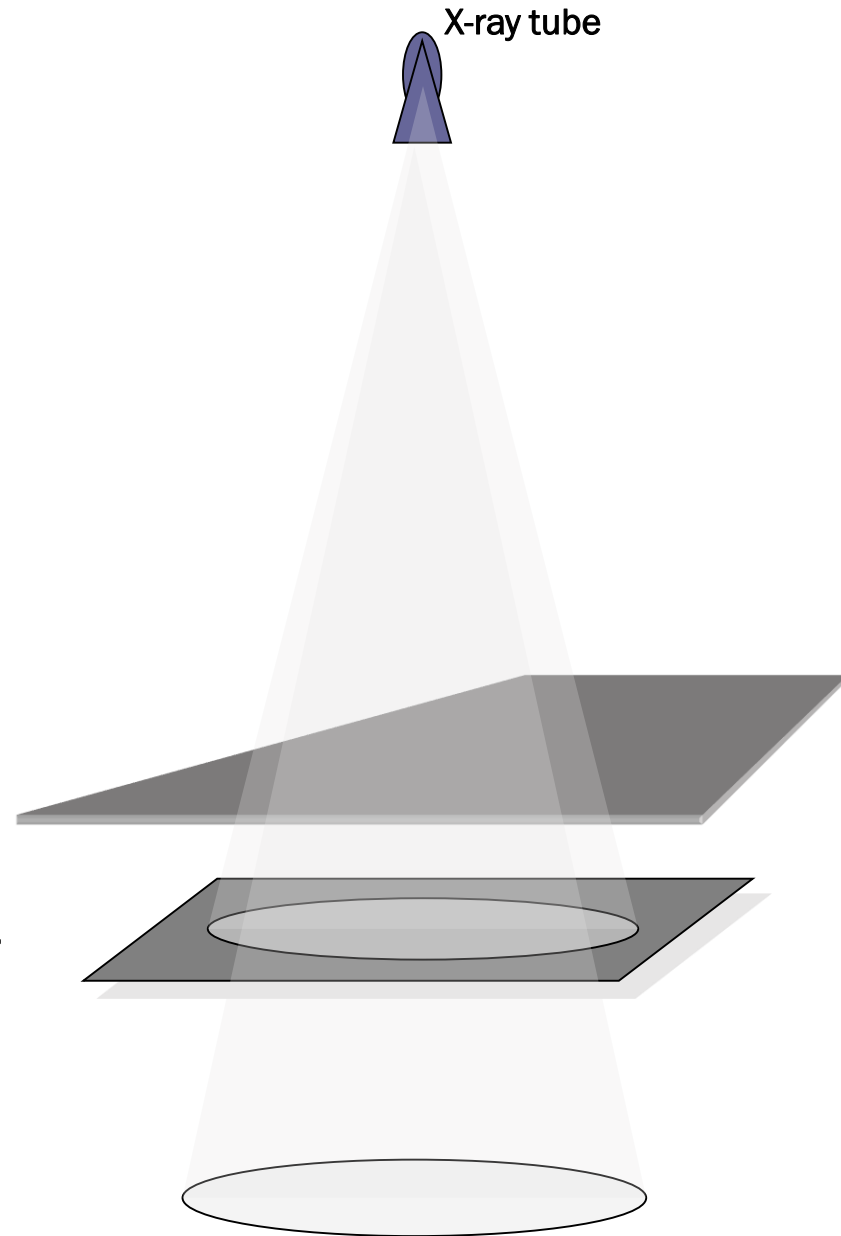
Outline

- Why realistic models of abnormalities?
- Our approach and advances
- Exploitation of results in practice



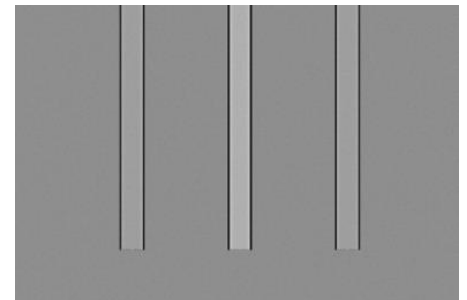
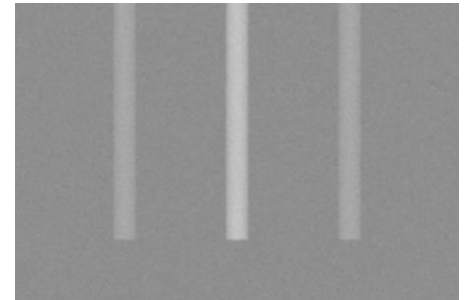
Mathematical phantom

Detector



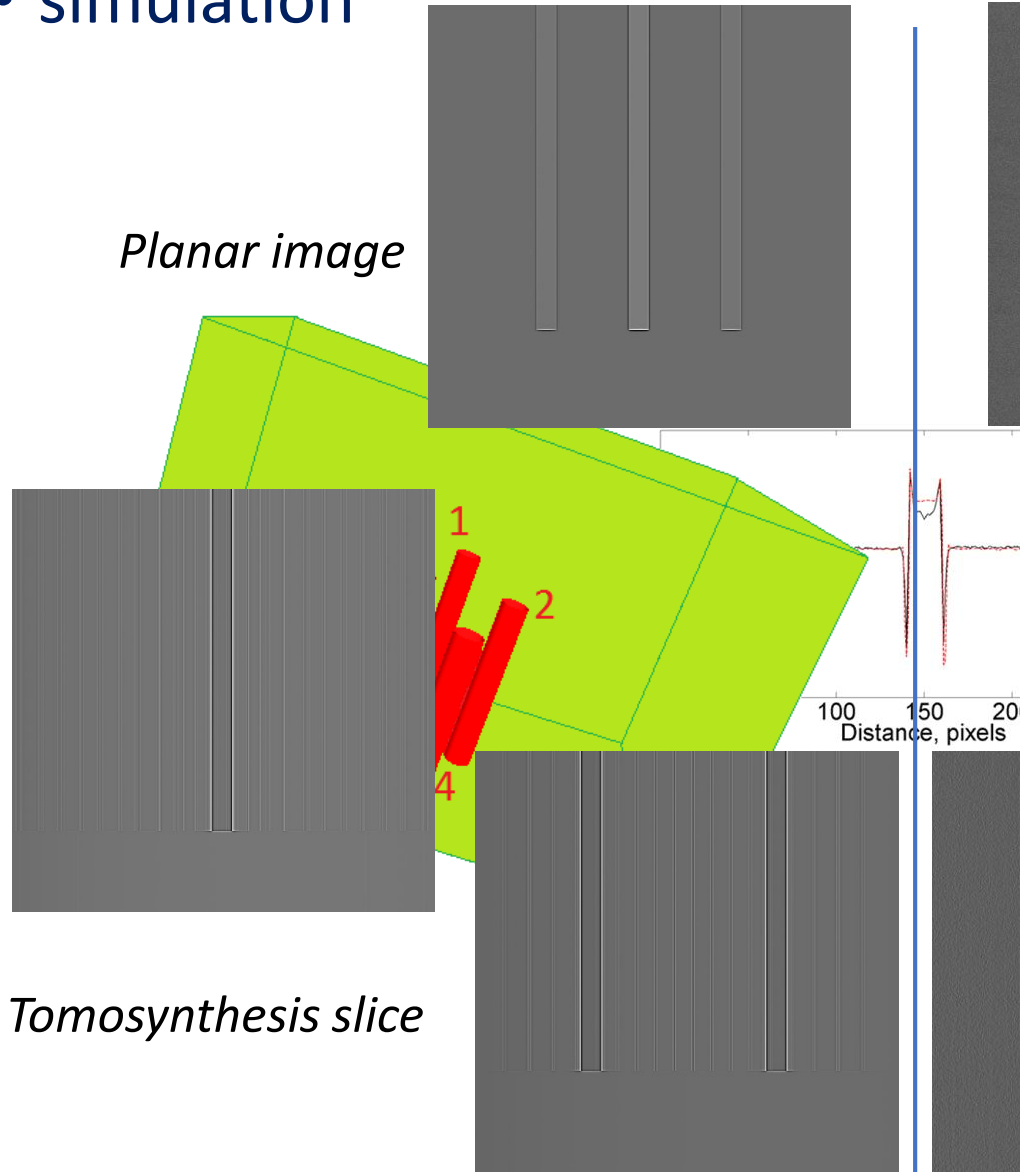
Simulation

Projection images

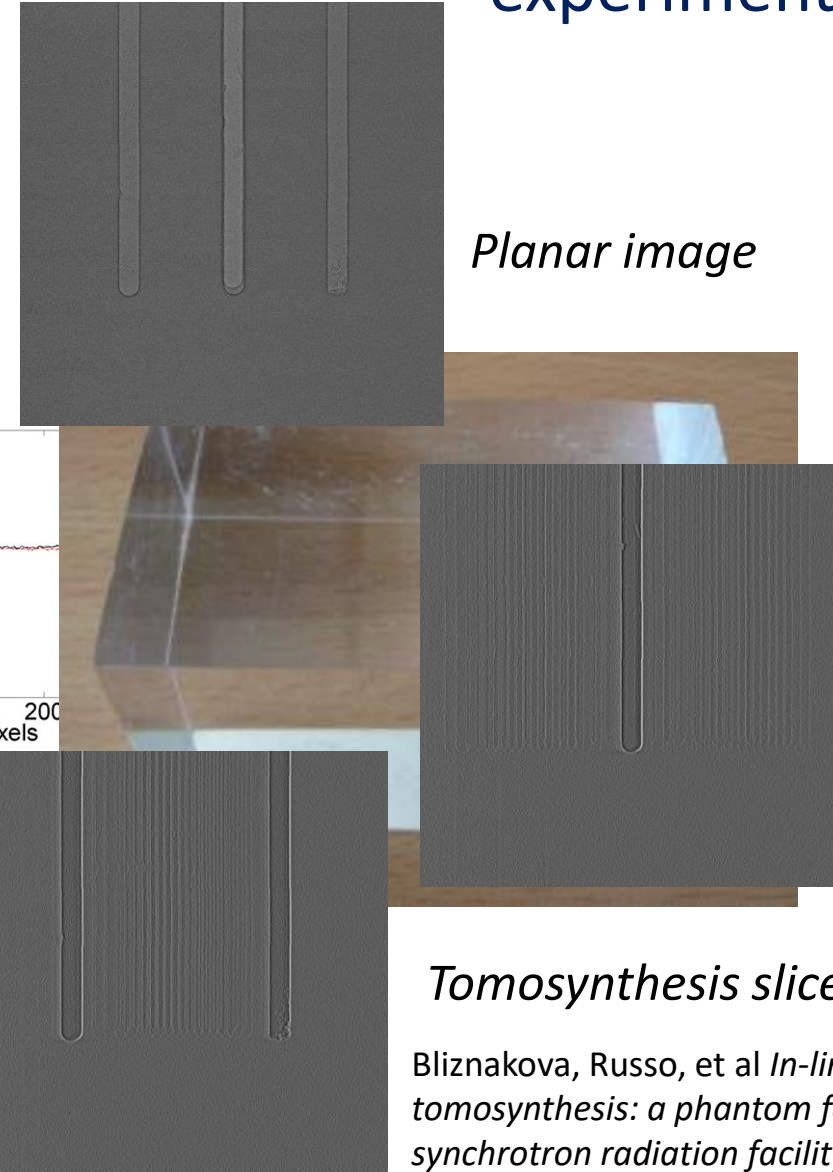


Earlier validation studies

- simulation

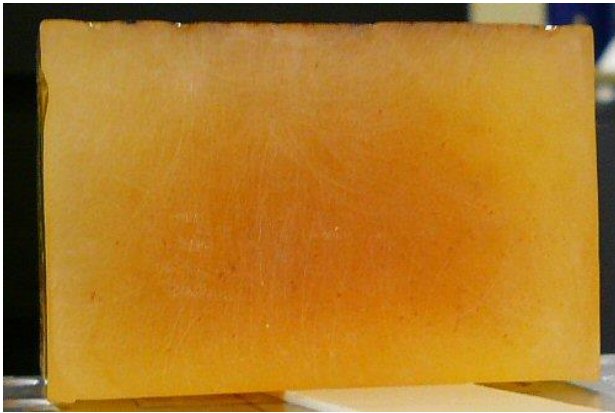
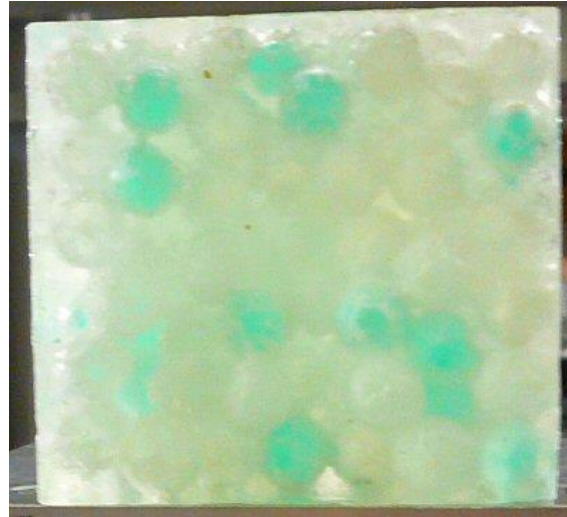
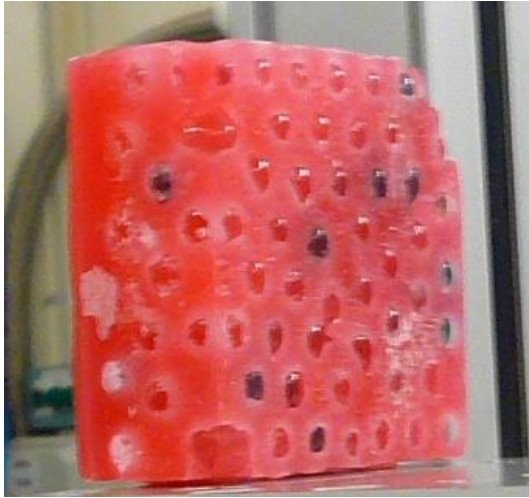


- experiment



Bliznakova, Russo, et al *In-line phase-contrast breast tomosynthesis: a phantom feasibility study at a synchrotron radiation facility*, PMB, 61(16):6243-63

Earlier validations

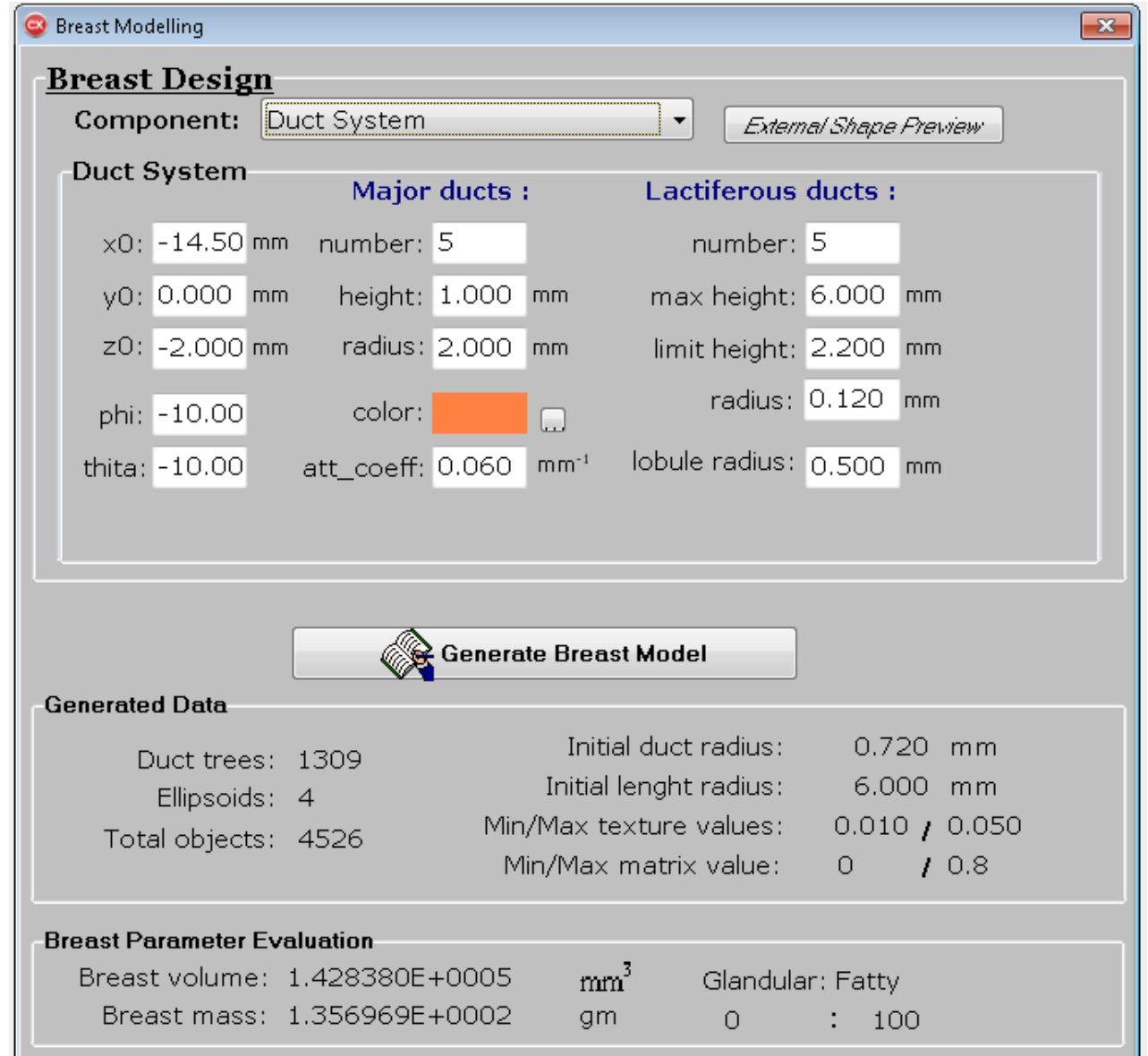


? Anthropomorphic breast phantoms ?

Creation of a Breast Model

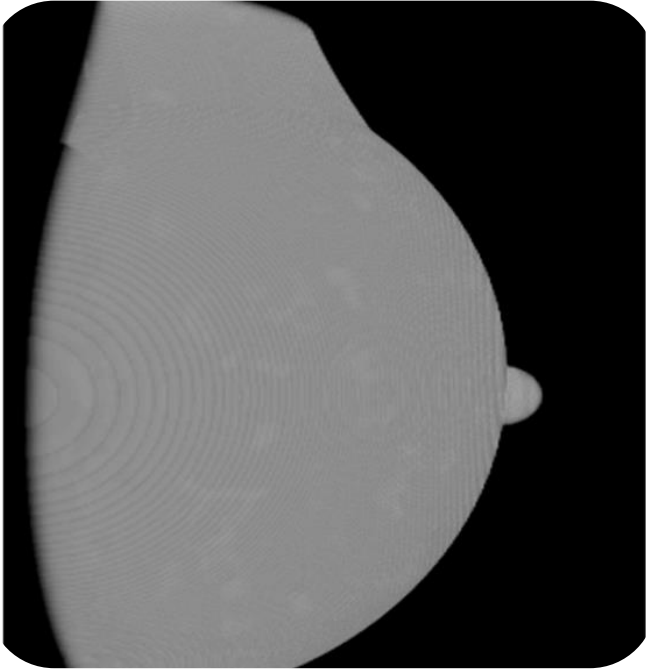
► Tool for creation of breast models.

- ✓ Shape
- ✓ Size
- ✓ Glandular tissues
- ✓ Adipose tissue
- ✓ Skin
- ✓ Abnormalities

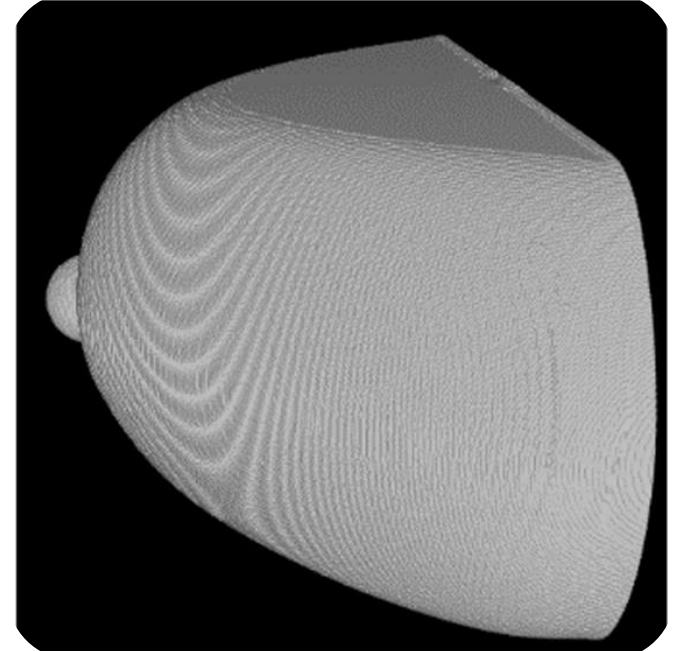


BreastSimulator

Anthropomorphic phantom

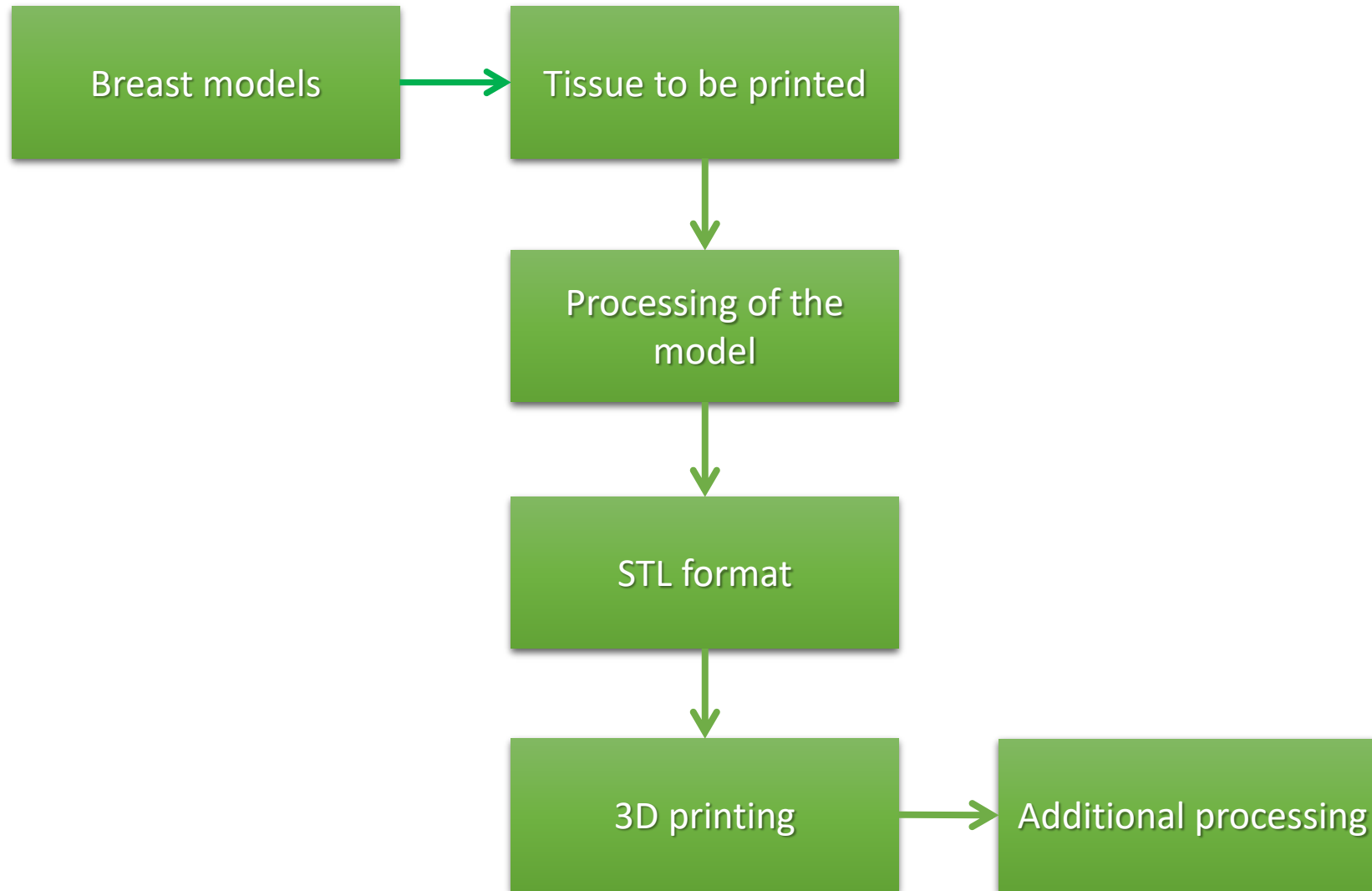


Modeled breast phantom

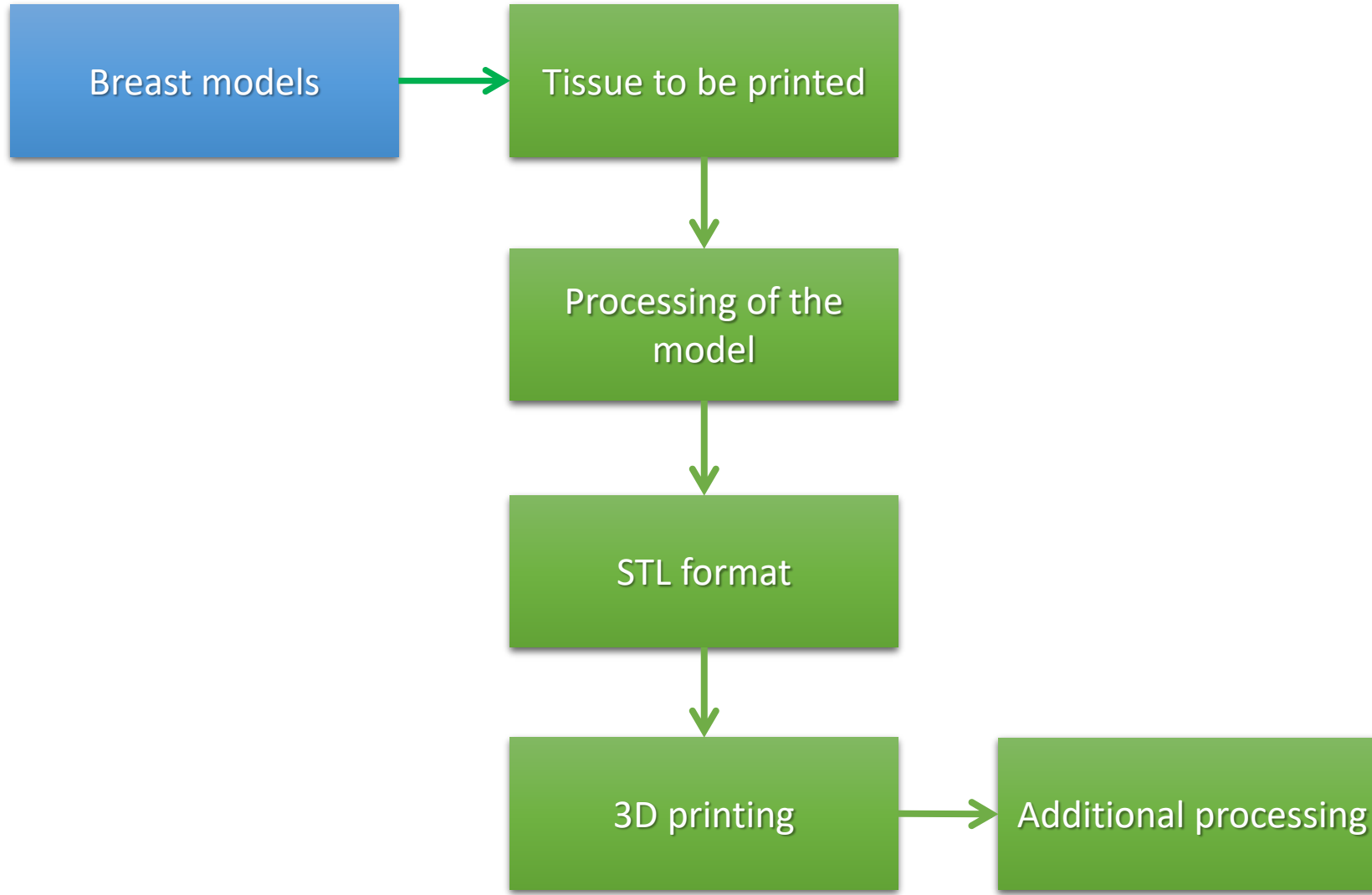
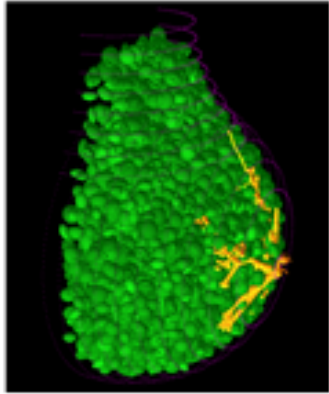


Compressed breast phantom

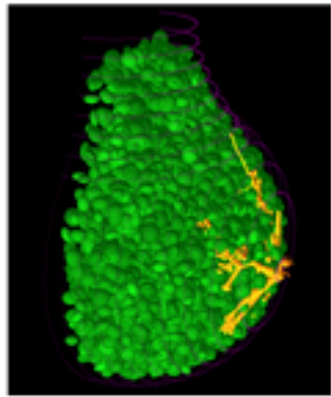
Development of physical breast phantoms for phase contrast imaging



Development of physical breast phantoms for phase contrast imaging



Development of physical breast phantoms for phase contrast imaging



Breast models

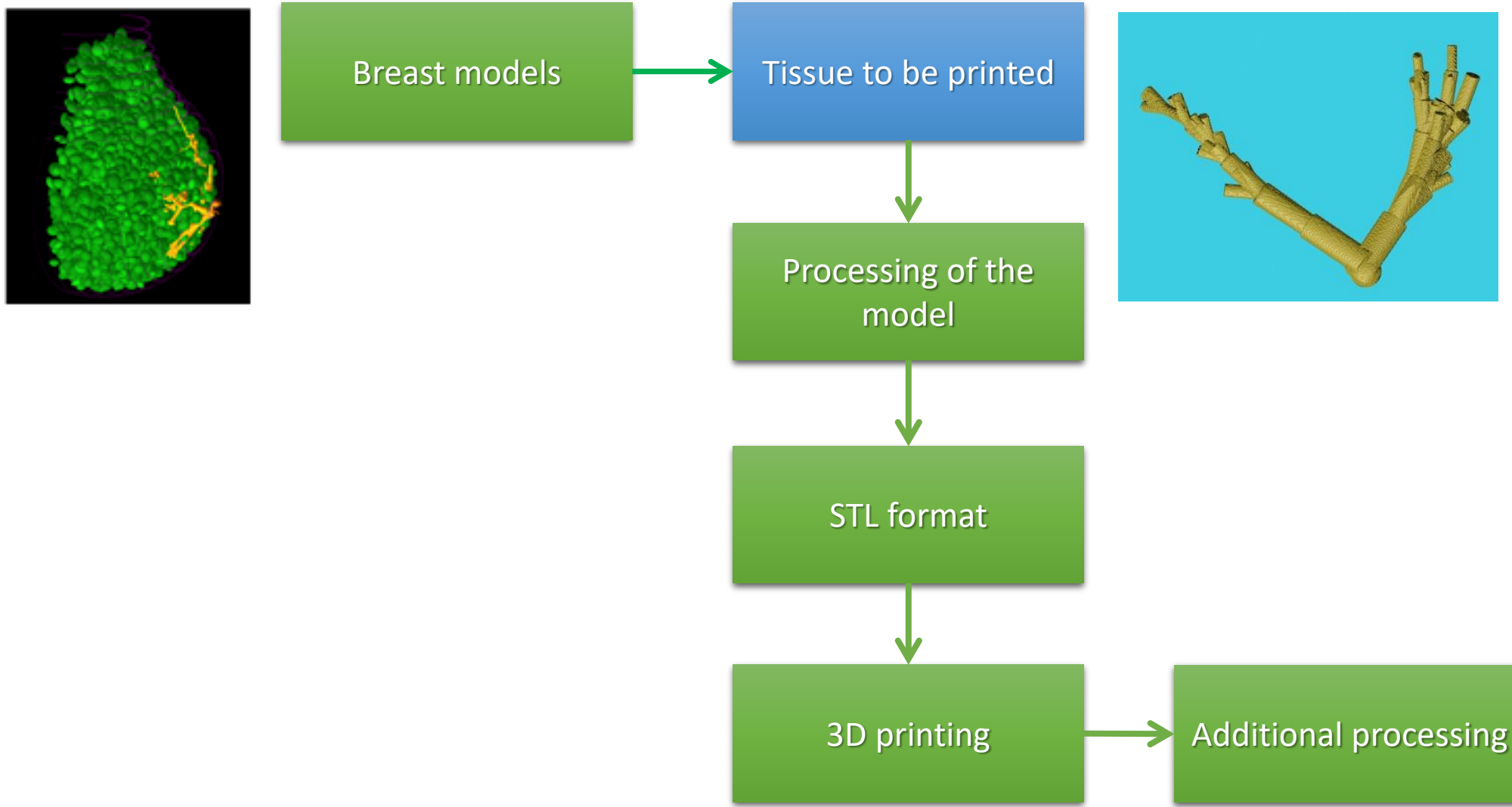
Tissue to be printed

Processing of the
model

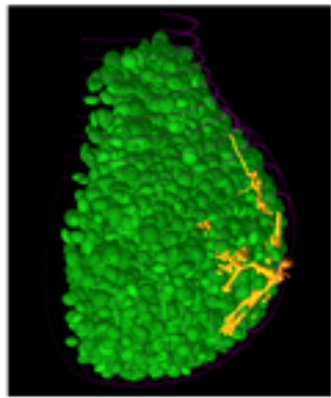
STL format

3D printing

Additional processing



Development of physical breast phantoms for phase contrast imaging



Breast models

Tissue to be printed



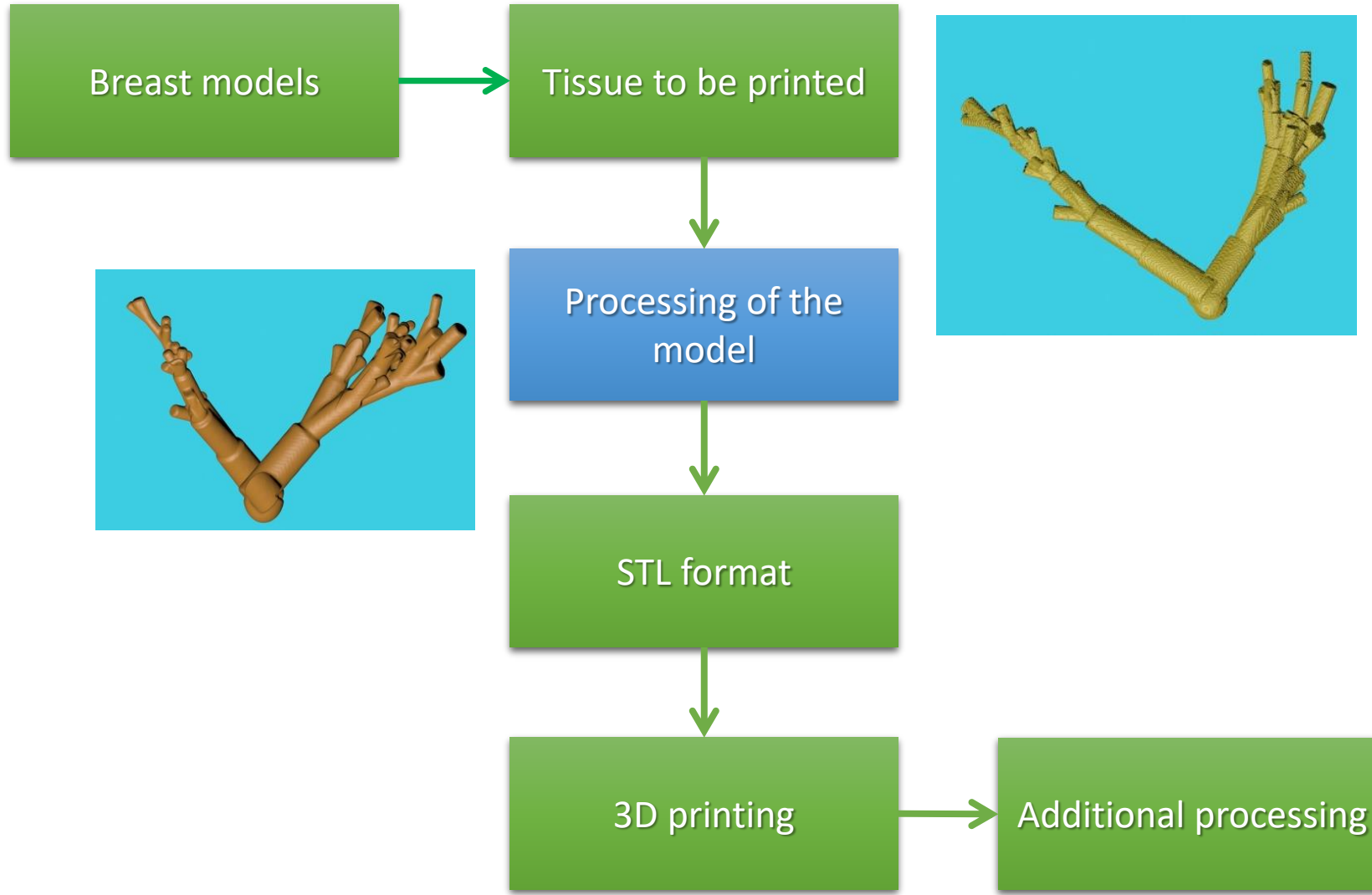
Processing of the model



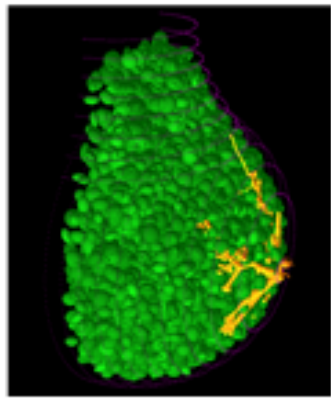
STL format

3D printing

Additional processing

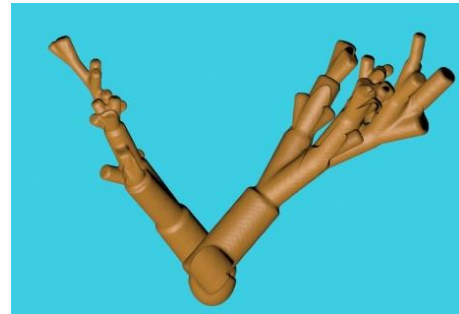


Development of physical breast phantoms for phase contrast imaging



Breast models

Tissue to be printed



Processing of the model



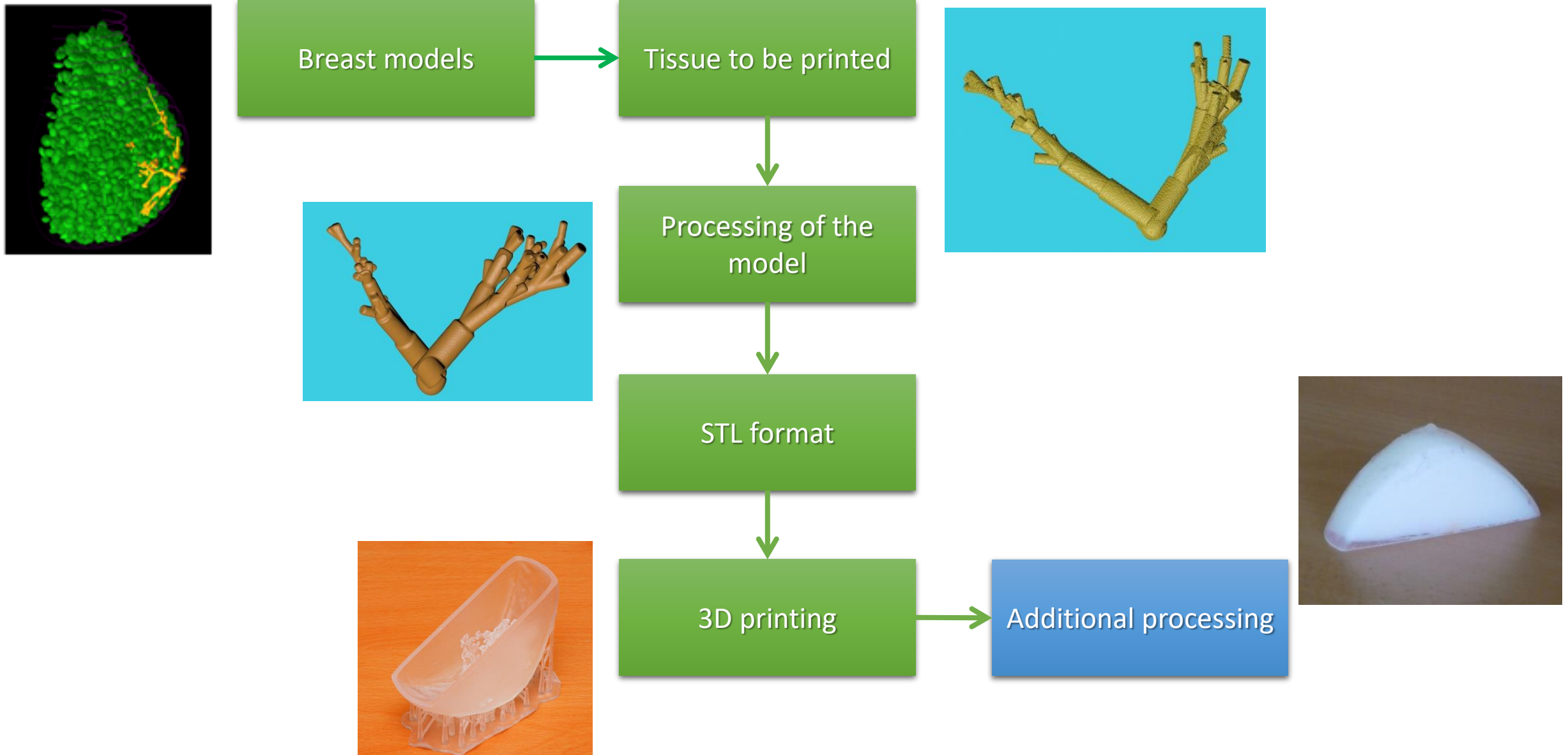
STL format

3D printing

Additional processing



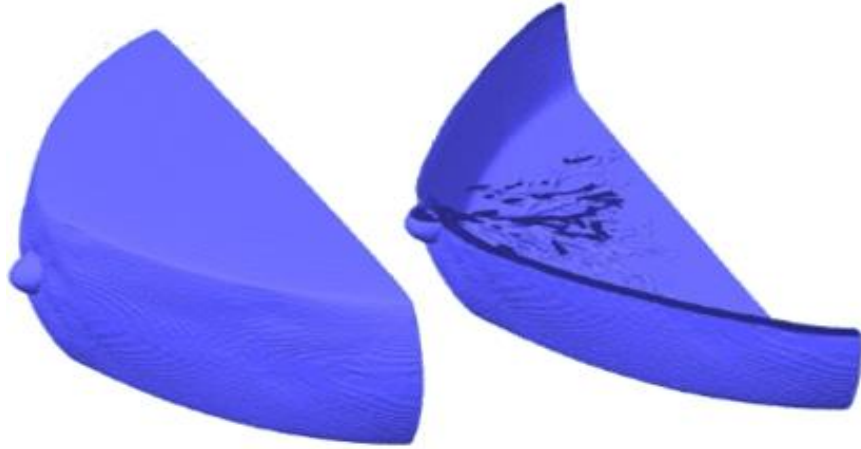
Development of physical breast phantoms for phase contrast imaging



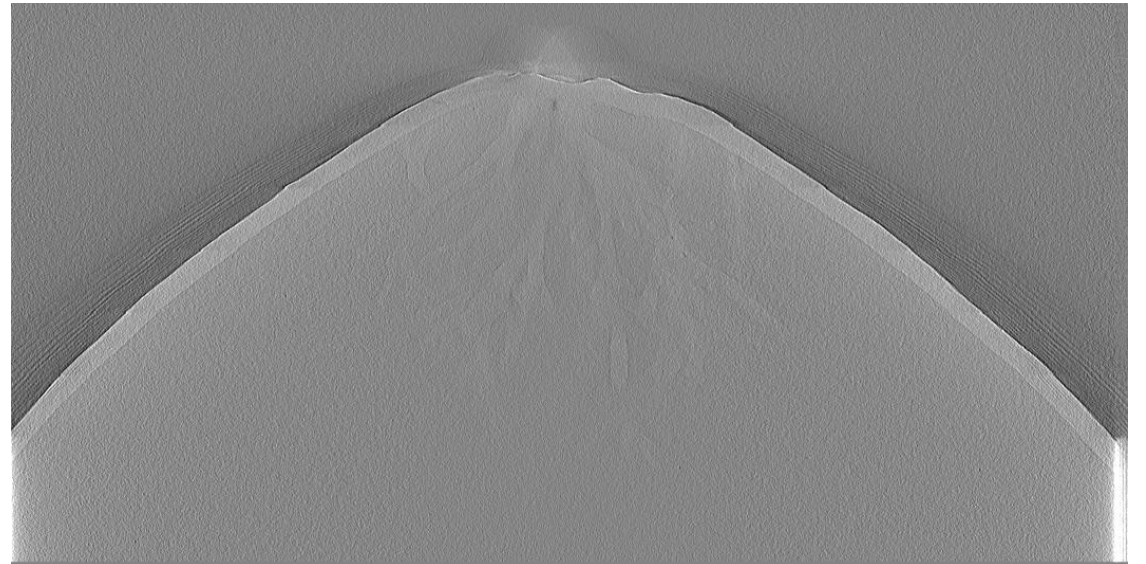
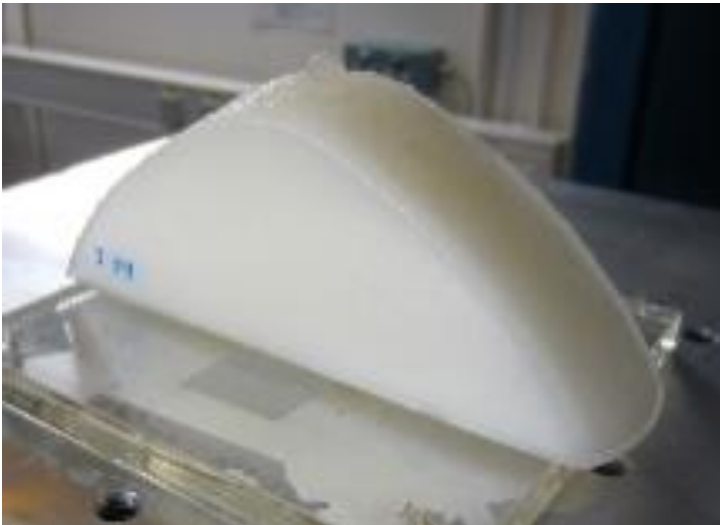


Anthropomorphic phantoms

- Breast shape – Clear resin;
- Glandular tree – Clear resin;

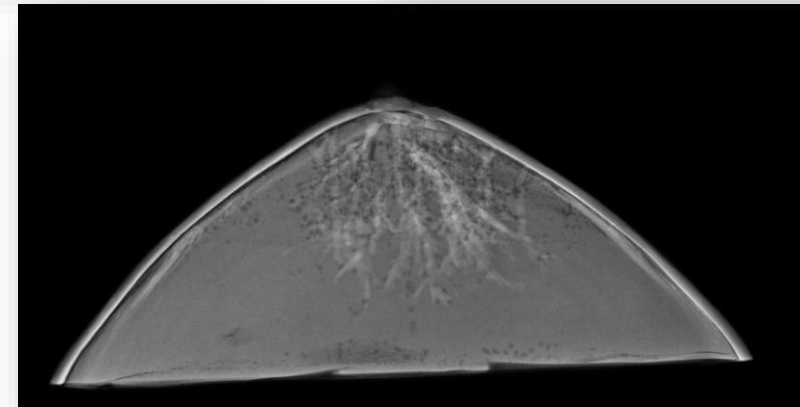
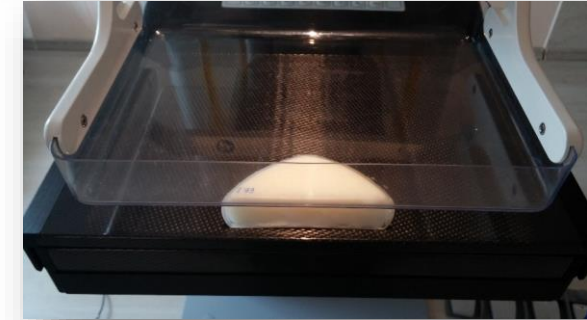
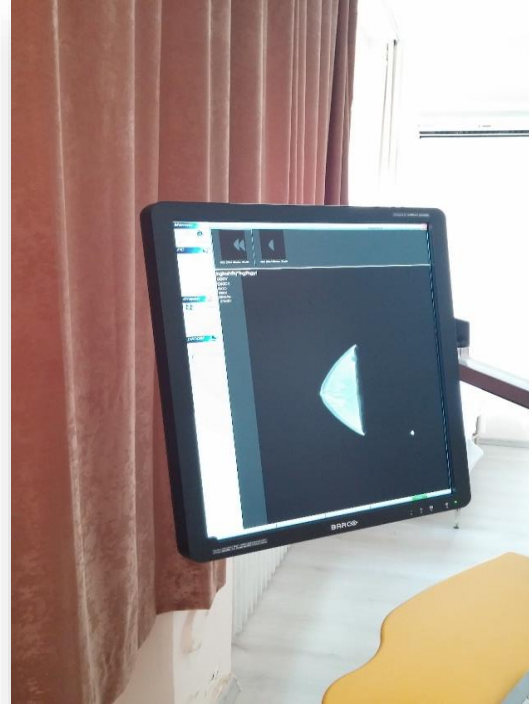


- Animal fat;
- Thickness – 31 mm;
- Wall thickness – 1.7 mm.



Development of physical breast phantoms for phase contrast imaging

Physical phantoms



Courtesy Danail Ivanov et al, FOCHOS, 2016



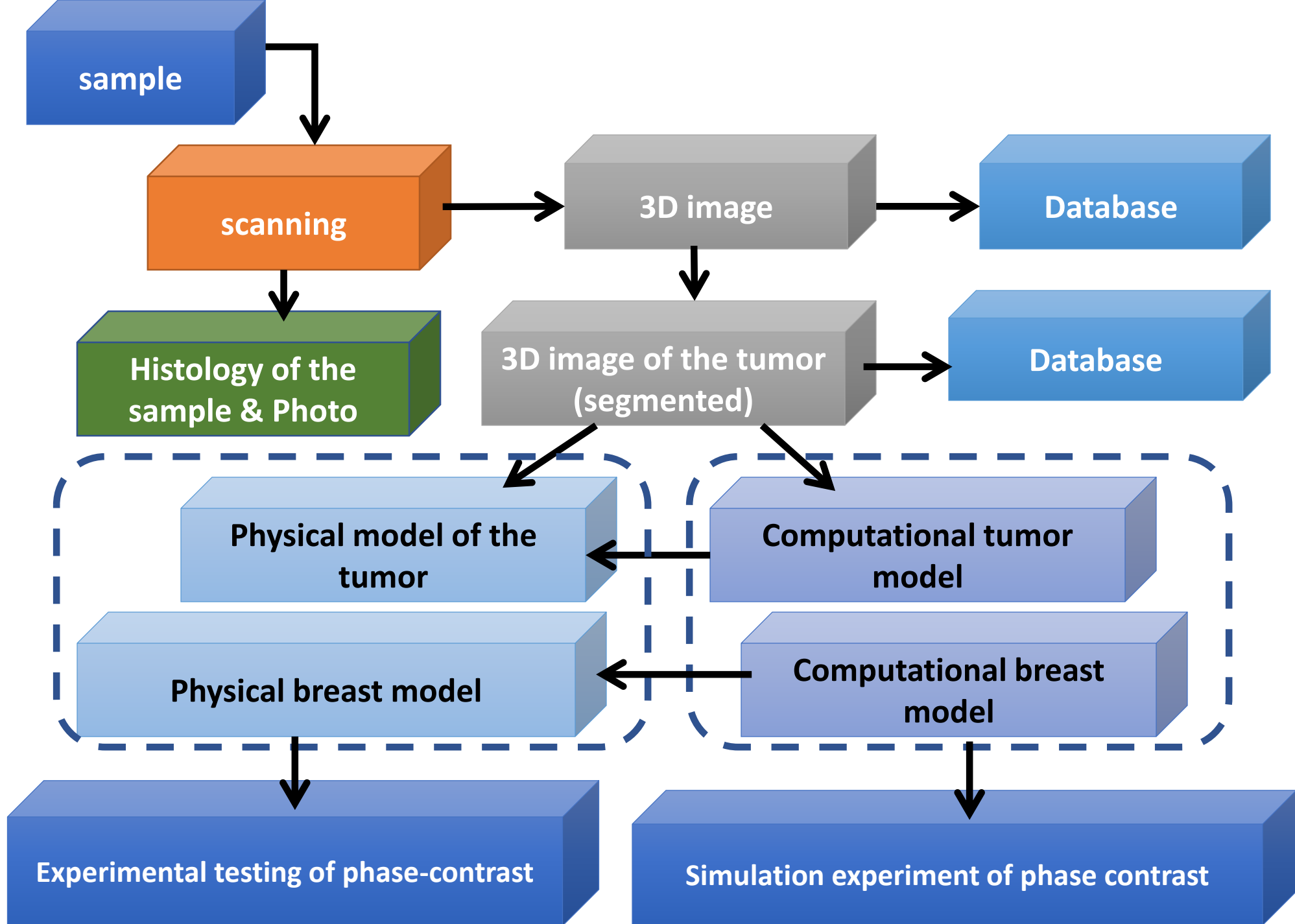
**? Realistic in shape,
size and absorption
properties tumors**

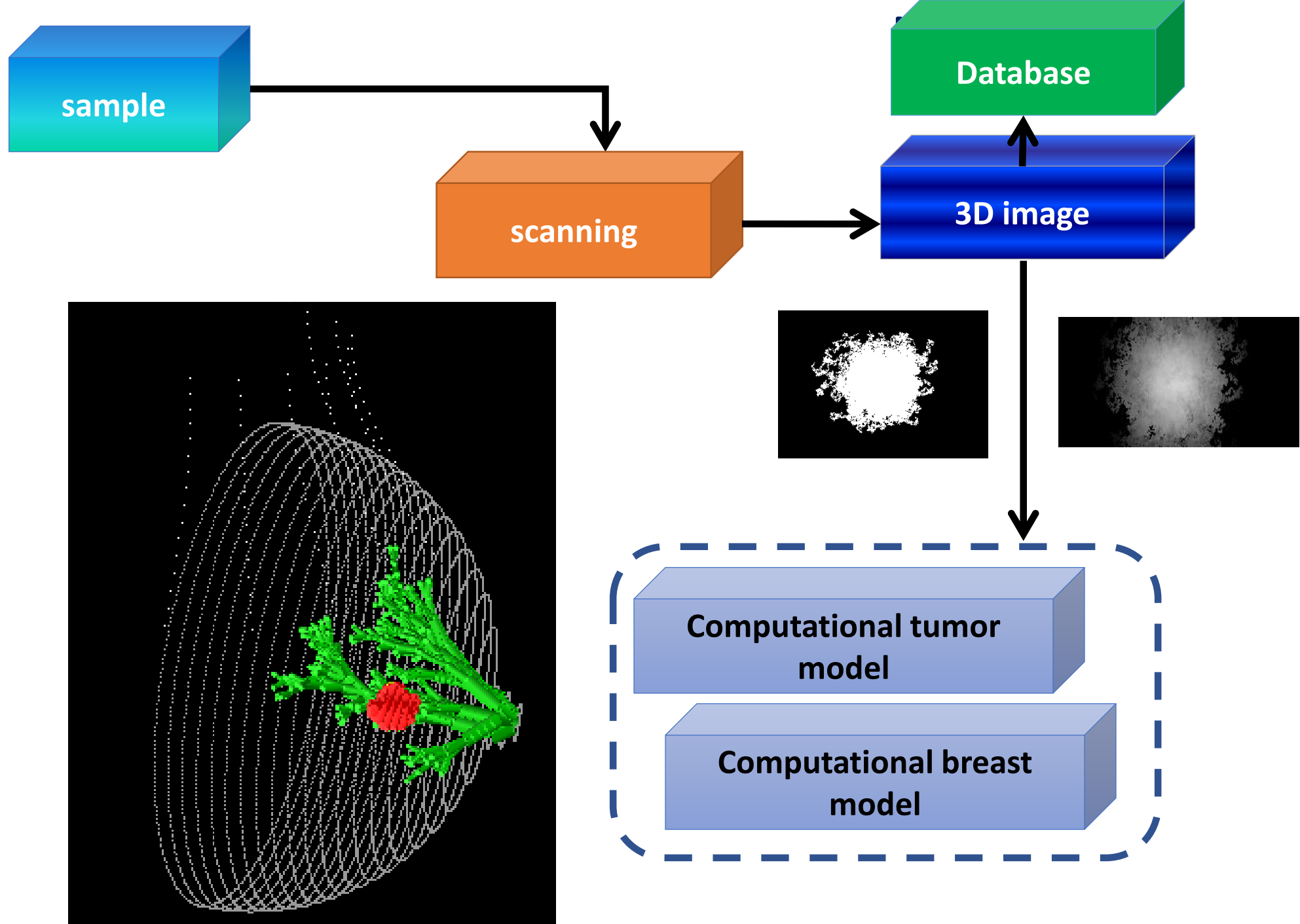
Outline

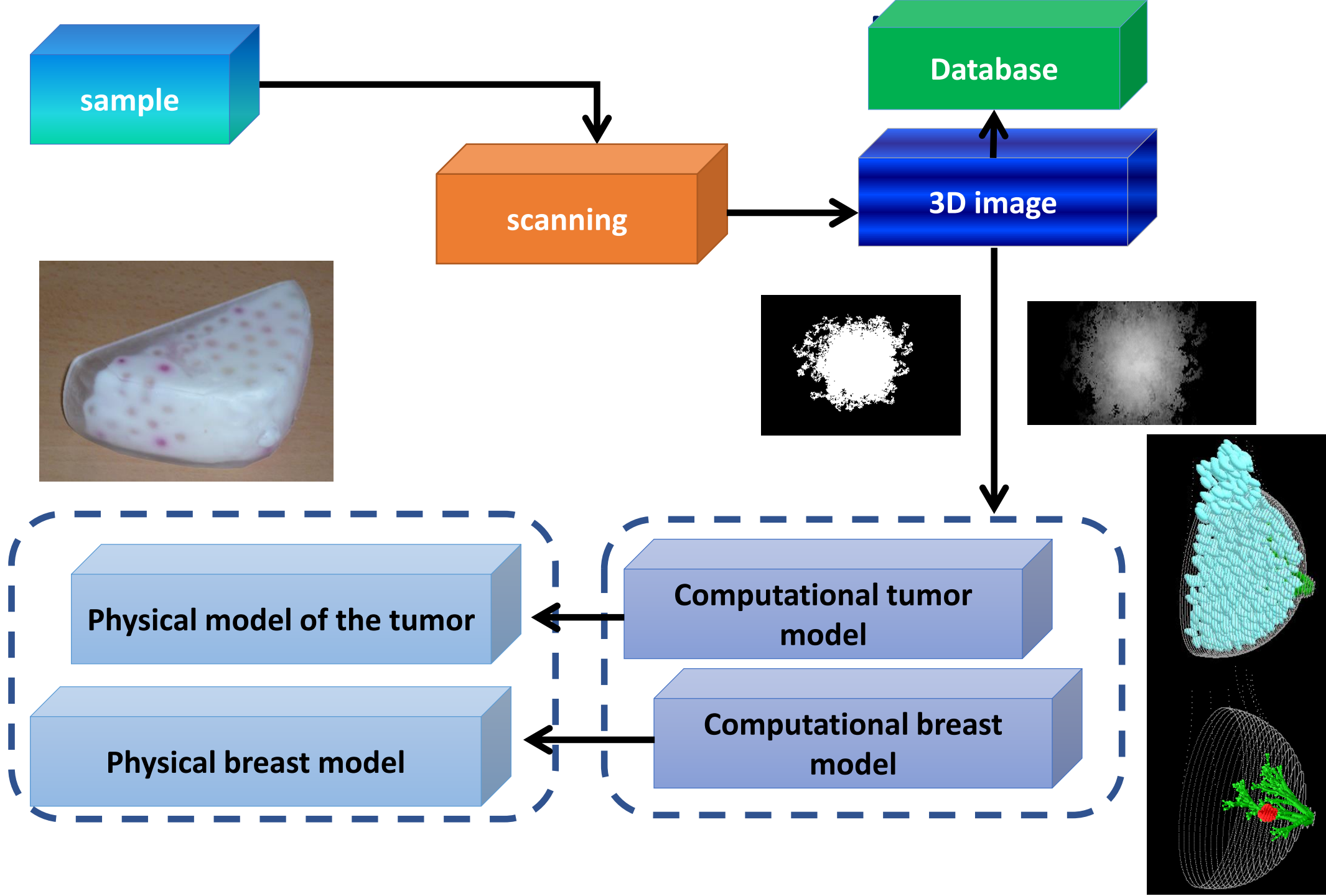
- Why realistic models of abnormalities?
- **Our approach and advances**
- Exploitation of results in practice

The Maxima objective

- *The **main objective** of the project is to increase the research and innovation capacity of the host organisation in the field of computational modelling of breast tumours and their use in studies of advanced x-ray breast imaging techniques such as breast tomosynthesis and phase contrast imaging.*







Aim

To develop

the MaXIMA Breast Tumours Models' Database, which is intended to provide researchers with computer-based breast tumours models, both:

- Segmented from Patient data
- Mathematically modelled realistic in shape

Methods

Segmented lesions

- Sources
- Algorithms
- Evaluation
- Storage

Modelled lesions

- Mathematical algorithms
- Evaluation
- Storage

Methods

Segmented lesions

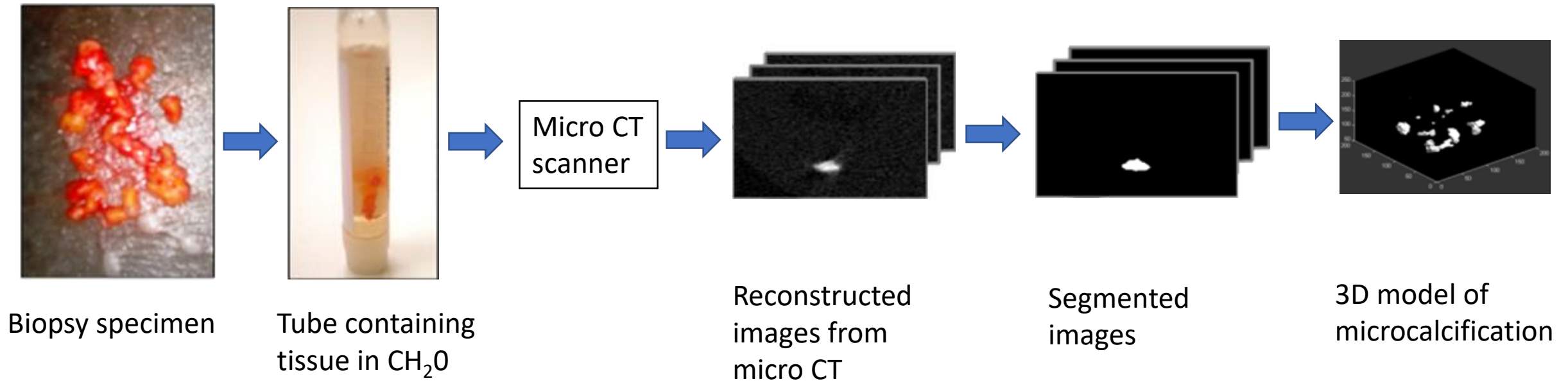
- Sources
- Algorithms
- Evaluation
- Storage

Modelled lesions

- Mathematical algorithms
- Evaluation
- Storage

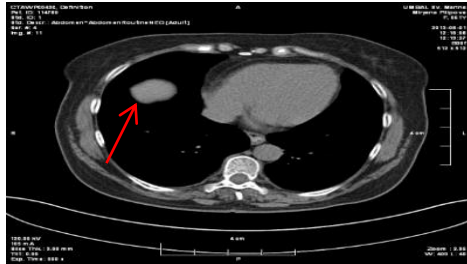
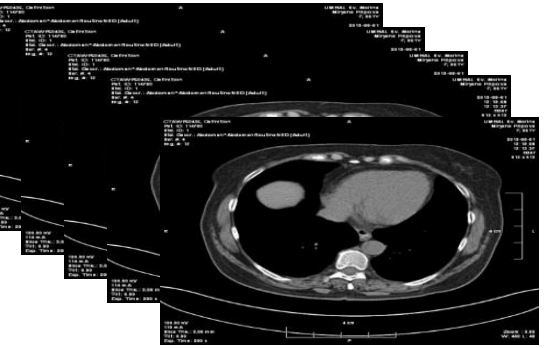
Segmented lesions

Initial idea



Courtesy of Prof Hilde Bosmans, KU Leuven

Idea



Input Data

Non contrast abdominal CT scans ✓

Defining the slide where the liver appears initially ✓

Click in the region of the liver ✓



For each slice

Region Growing within the slice ✓

Verify the segmented area ✓

Post-processing the segmented region ✓

Liver volume ✓



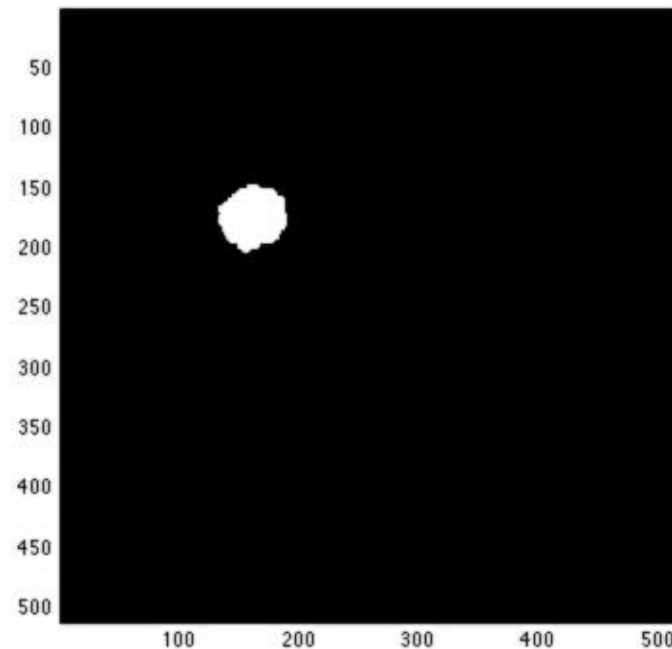
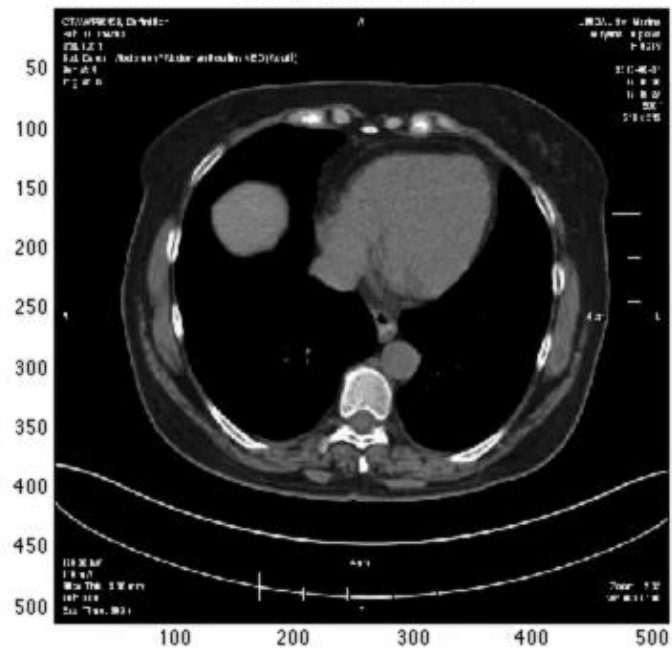
Outlining the tumor by the algorithm

example



Slice number 1 out of 156

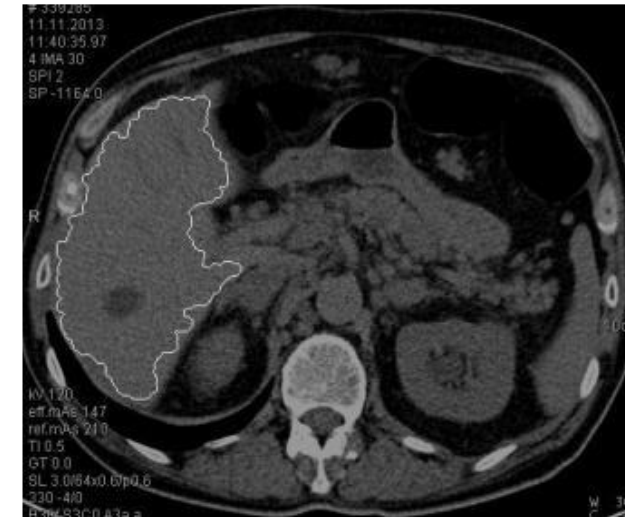
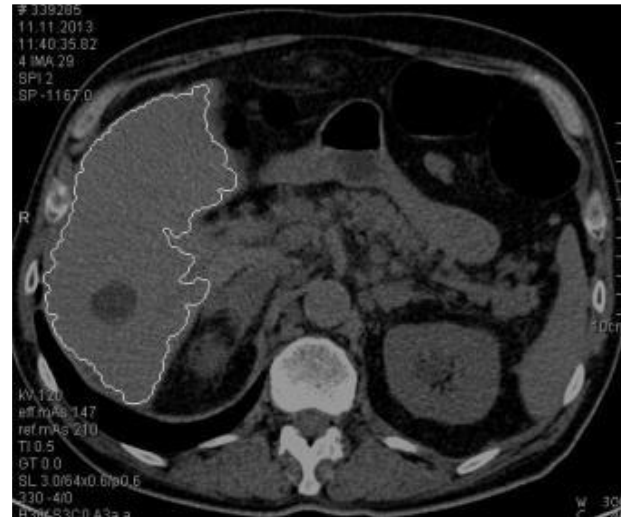
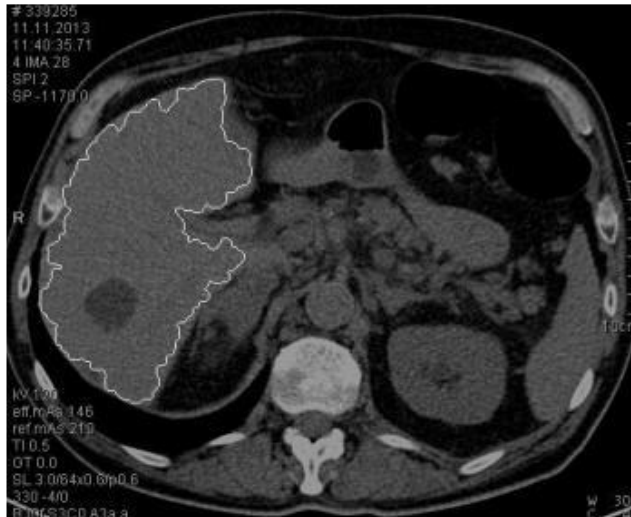
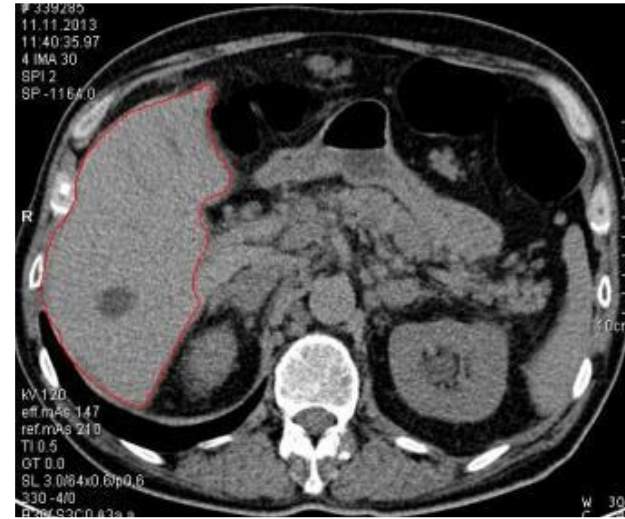
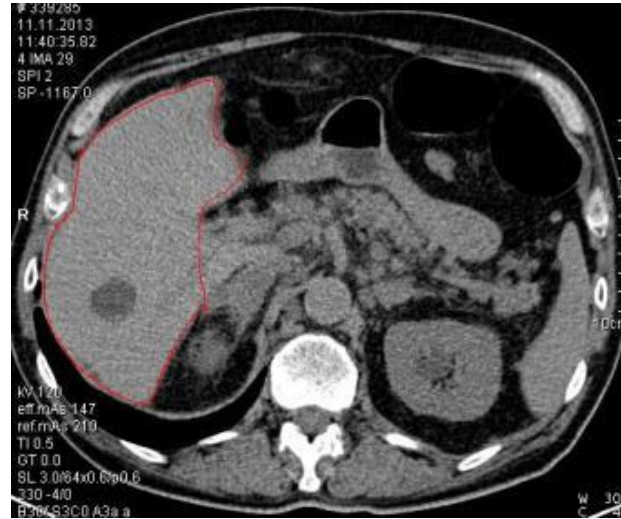
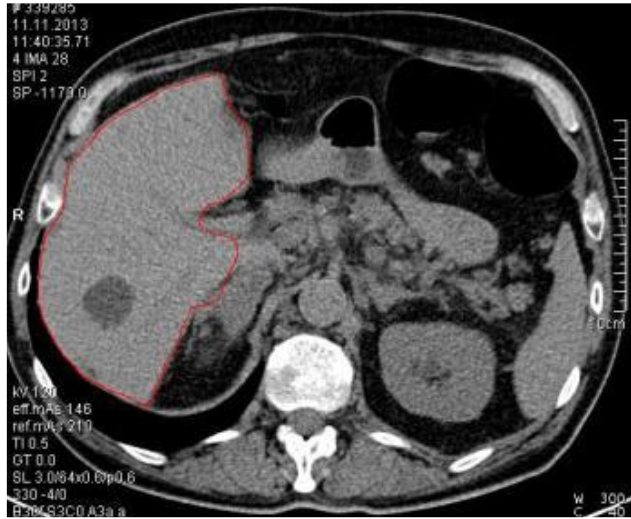
Slice number 12 out of 156



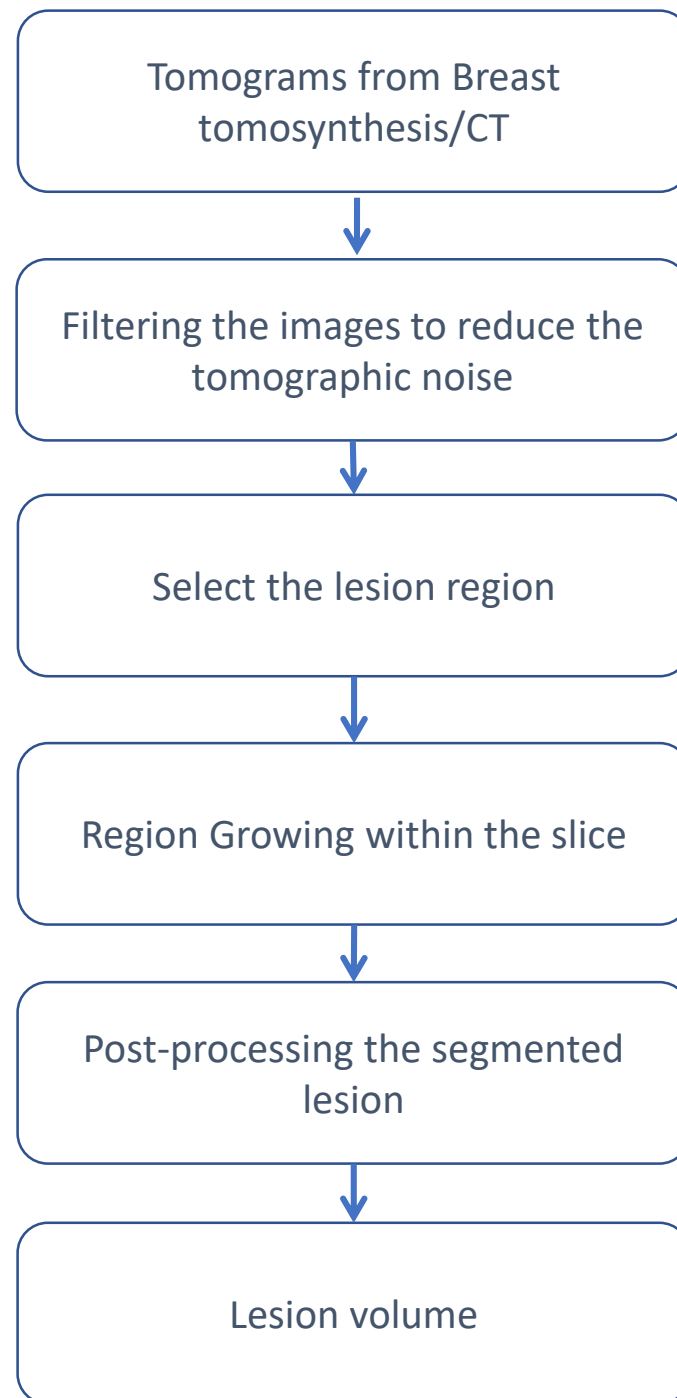
Outlining the tumor by a doctor



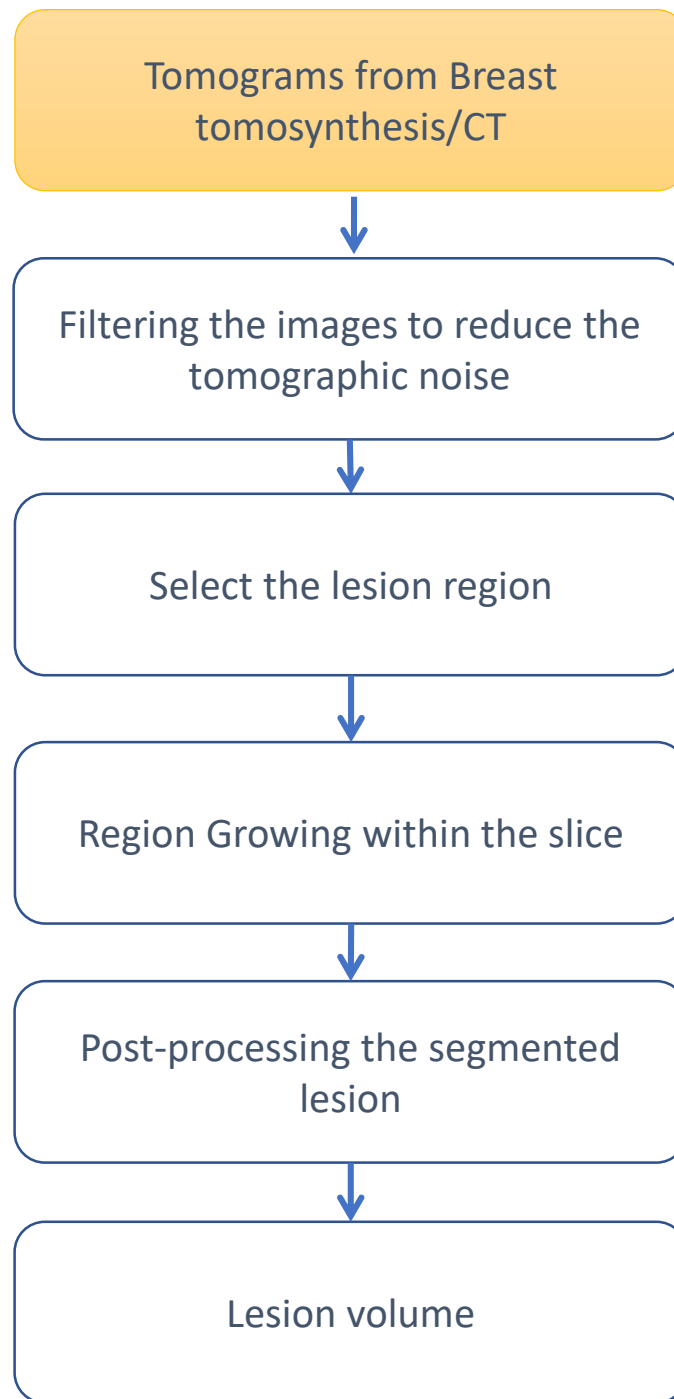
Comparison



Segmentation of lesions from patient data



Segmentation of lesions from patient data



Sources of data

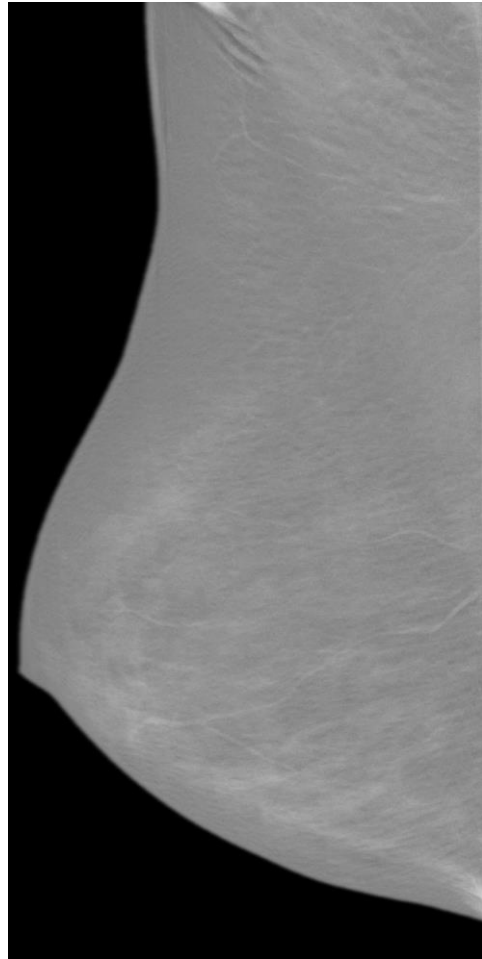
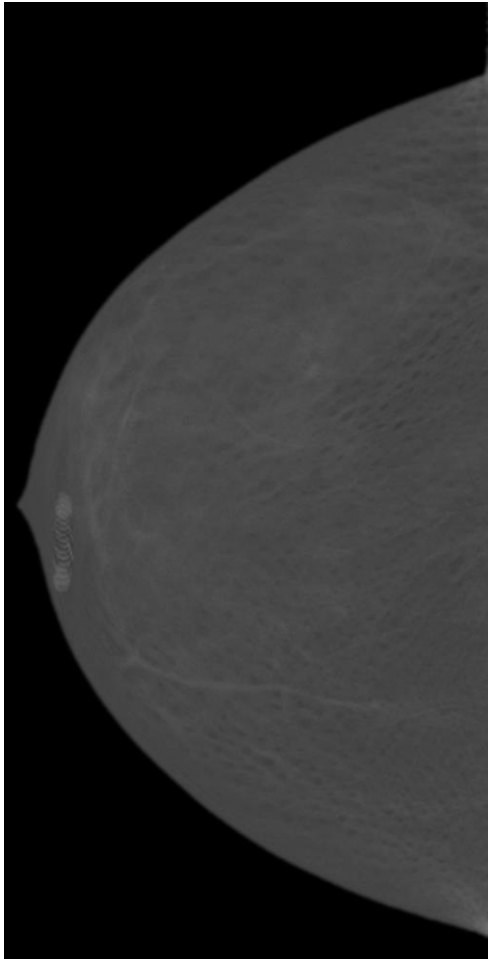
✓ CT patient data from
radiotherapy department

- Image size 512 x 512 pixels, 1.17mm x 1.17mm
- Slice thickness – 5 mm
- 188 slices of the whole body
- Philips GEMINI TF TOF 16



Courtesy: Nikolay Dukov, Fochos 2016

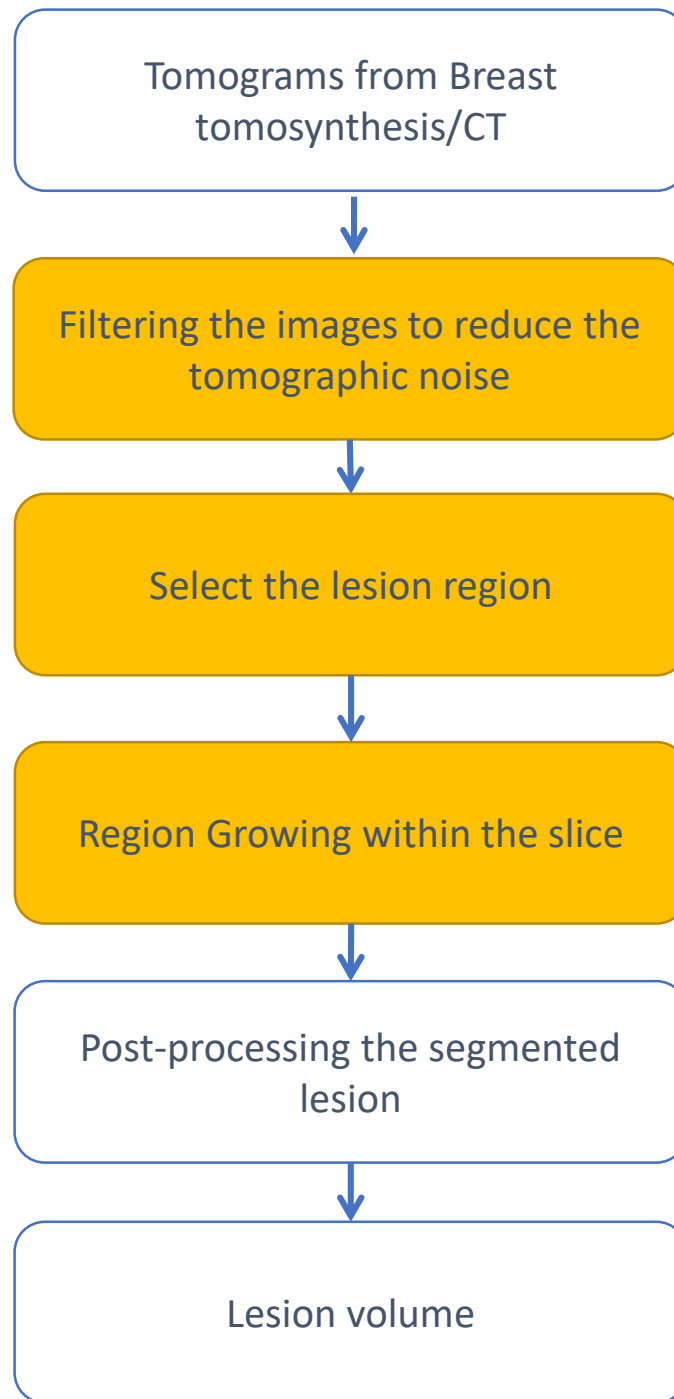
Sources of data



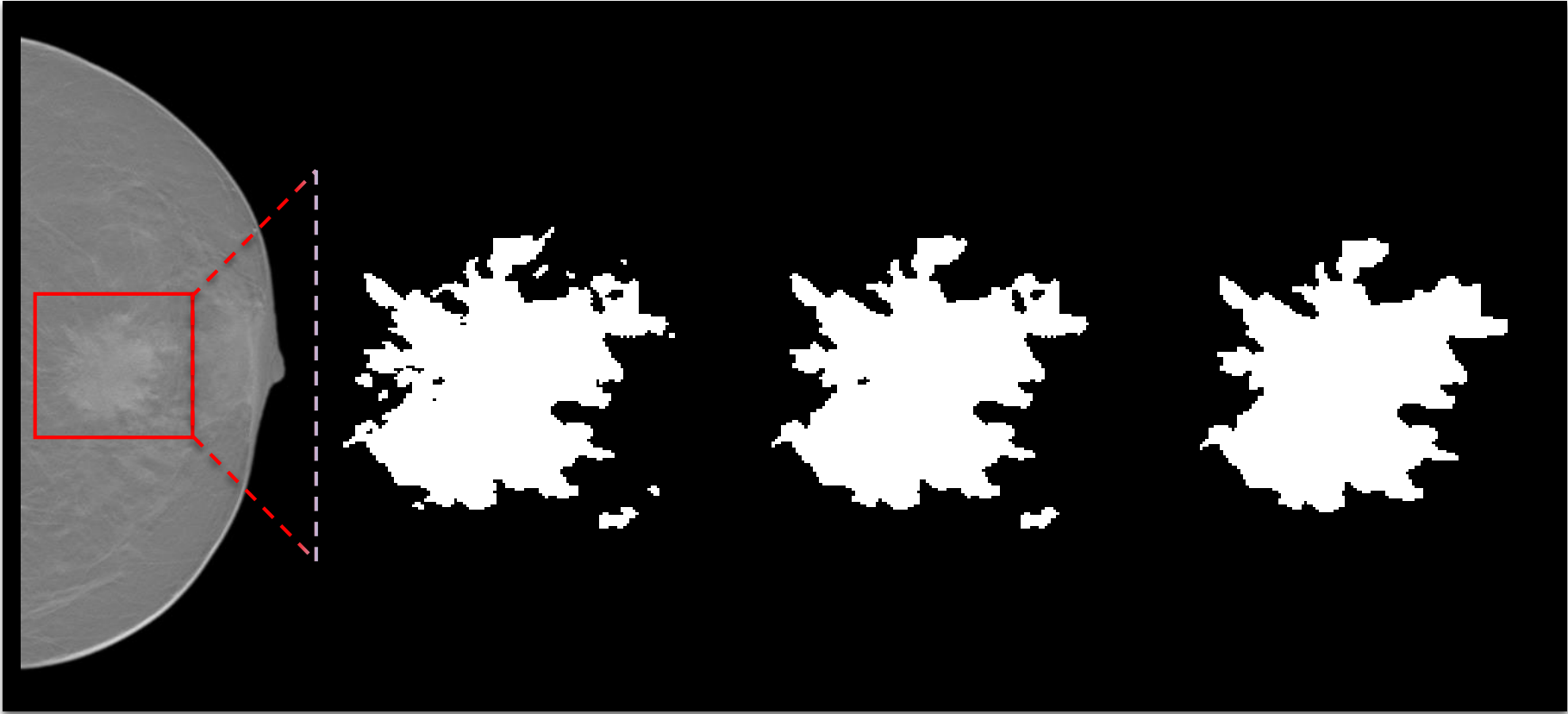
✓ Tomosynthesis – Alexandrovska Hospital, Sofia
University Hospital, Leuven

✓ CT - mastectomy University
Hospital of Varna

Segmentation of lesions from patient data



Segmenting the tumour area



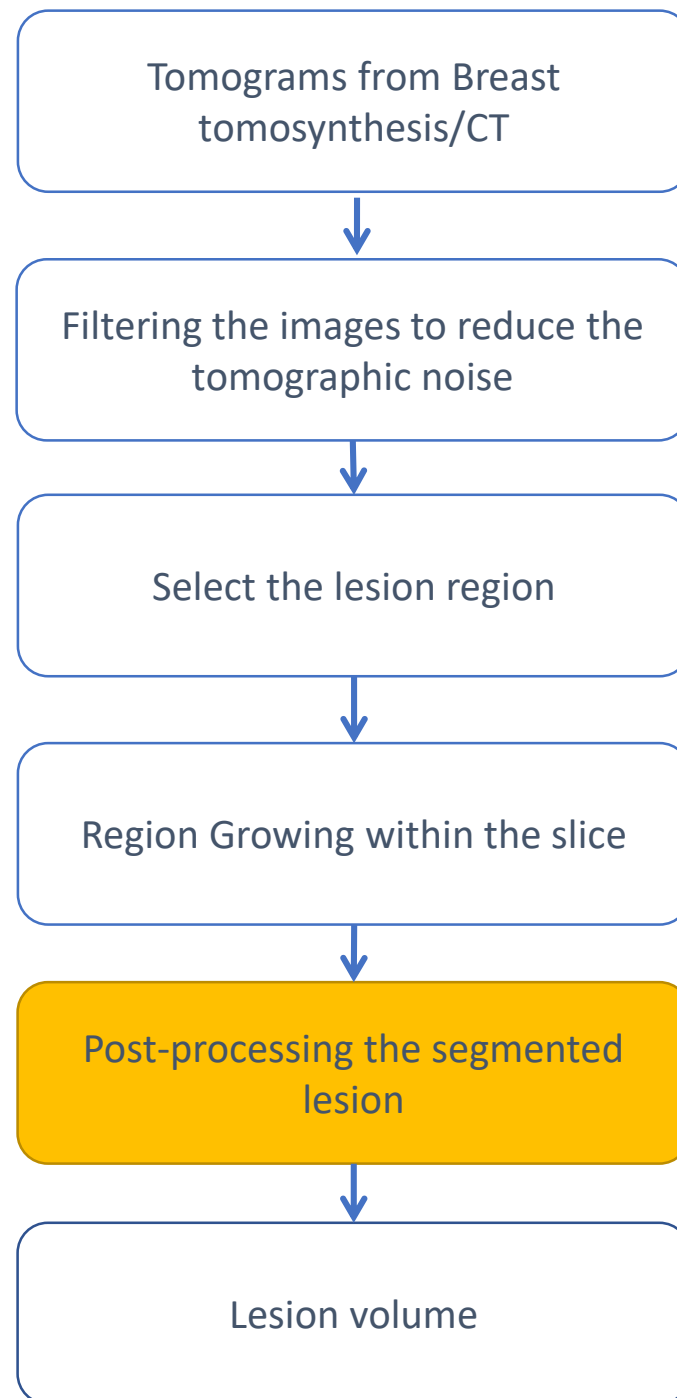
Choosing ROI

Obtaining binary image

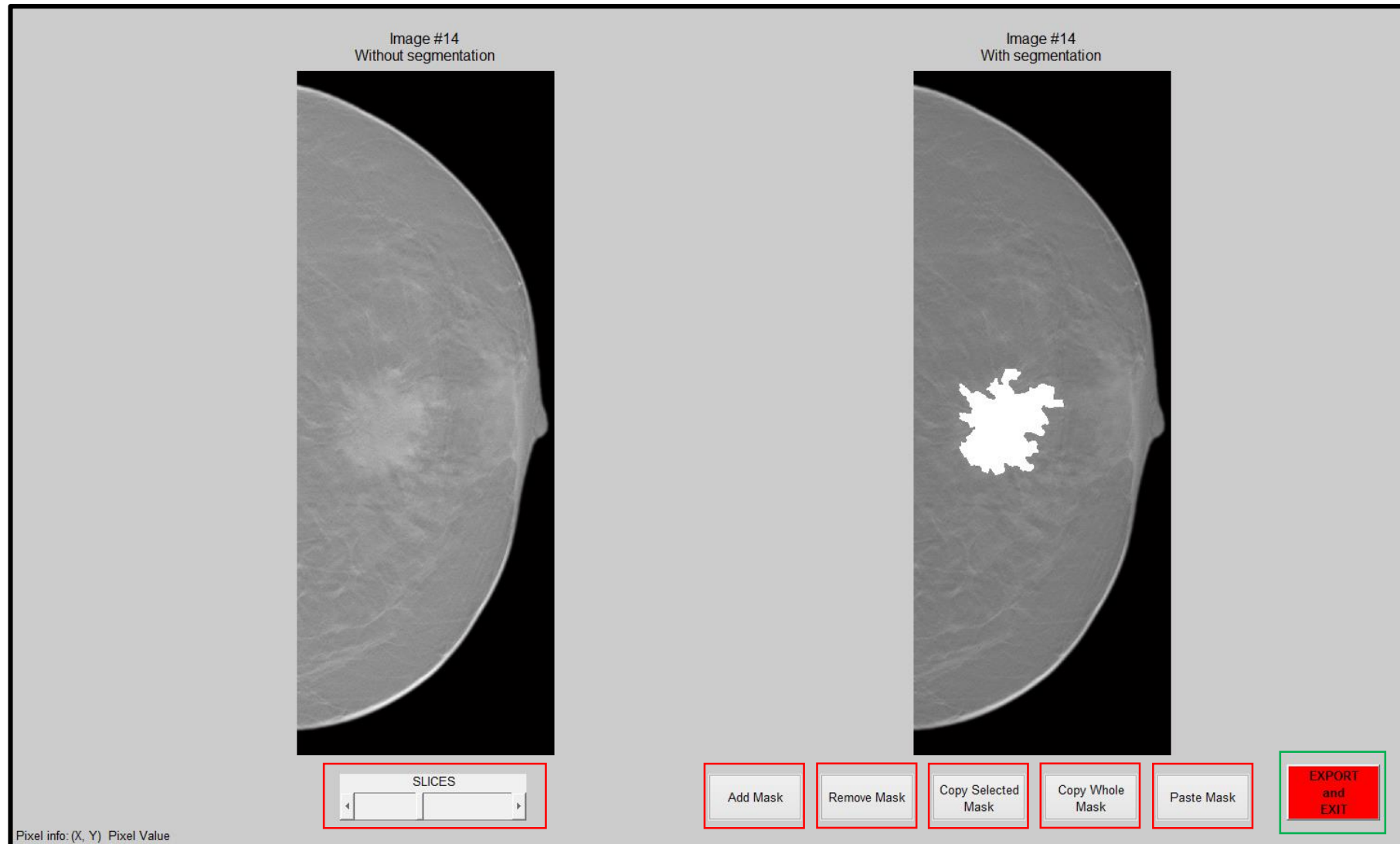
Artefact reduction

Tumor segmentation

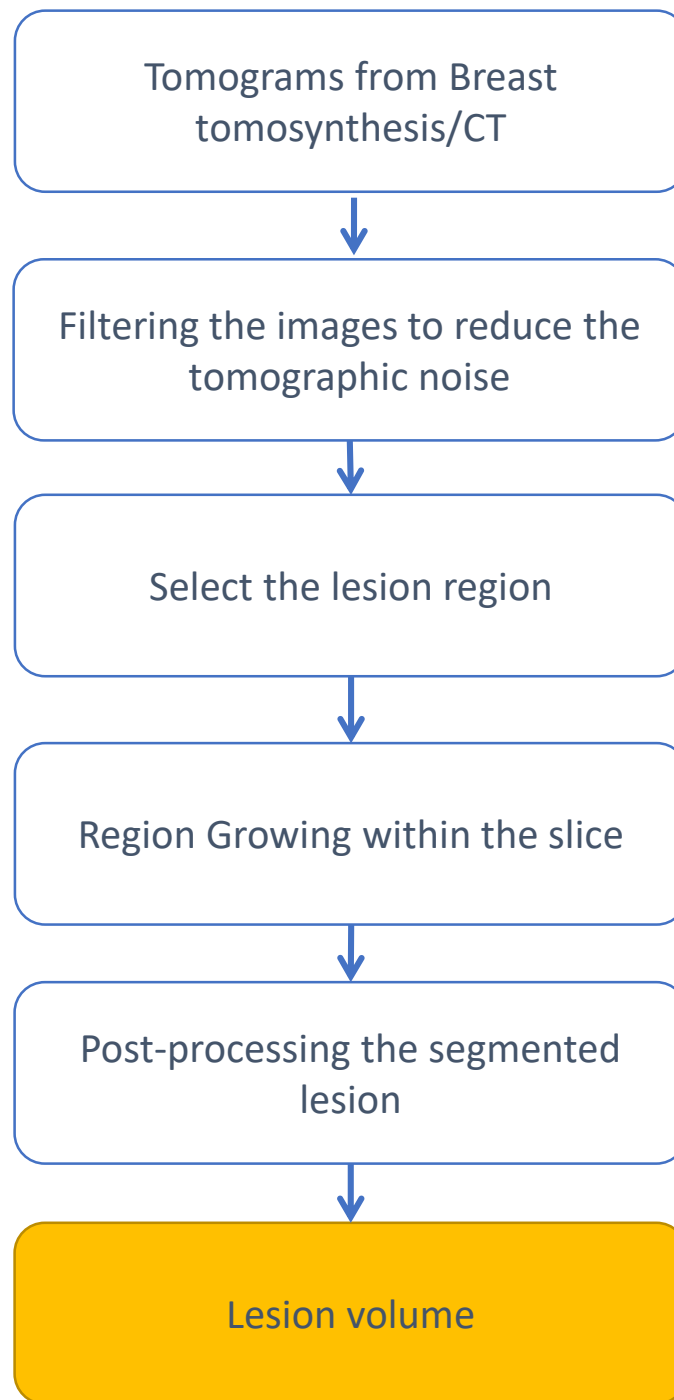
Segmentation of lesions from patient data



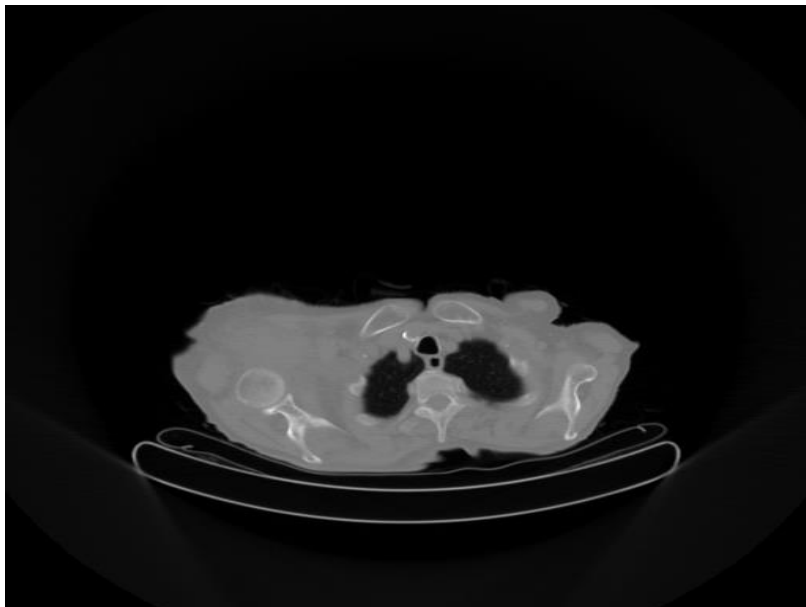
Manual post-processing



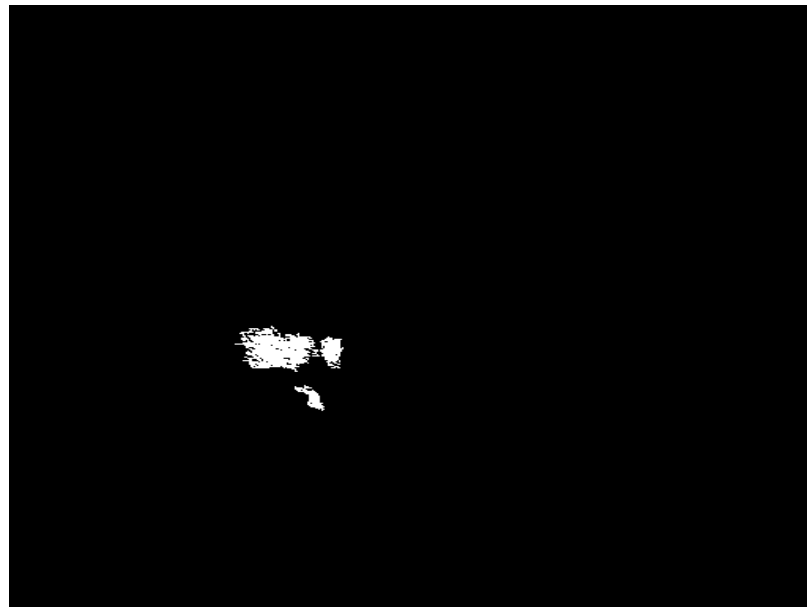
Segmentation of lesions from patient data



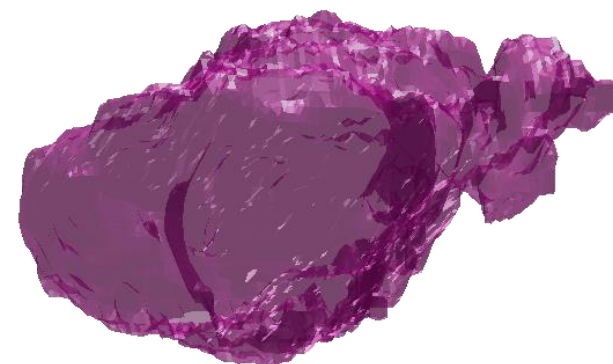
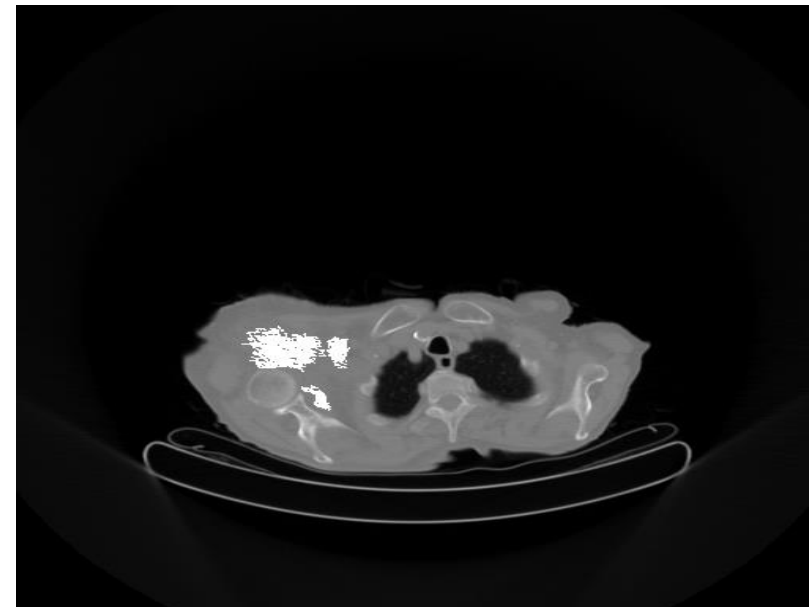
Unprocessed Images



Segmented images

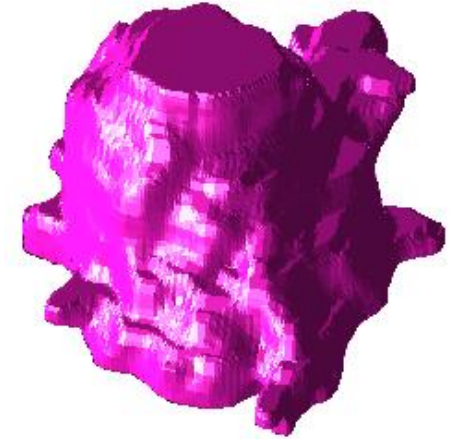
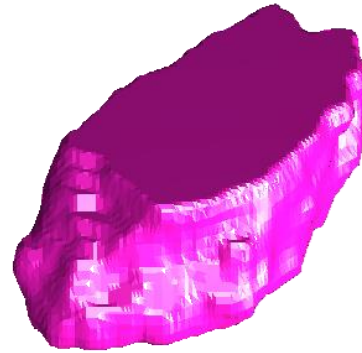
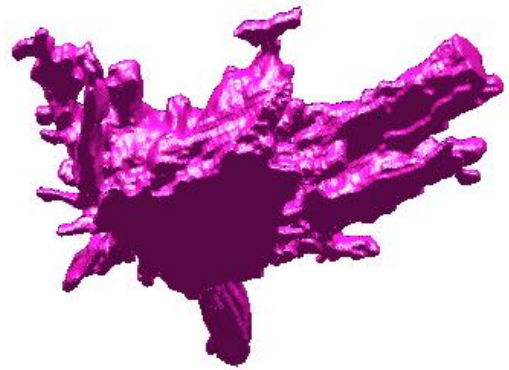


Combined Images

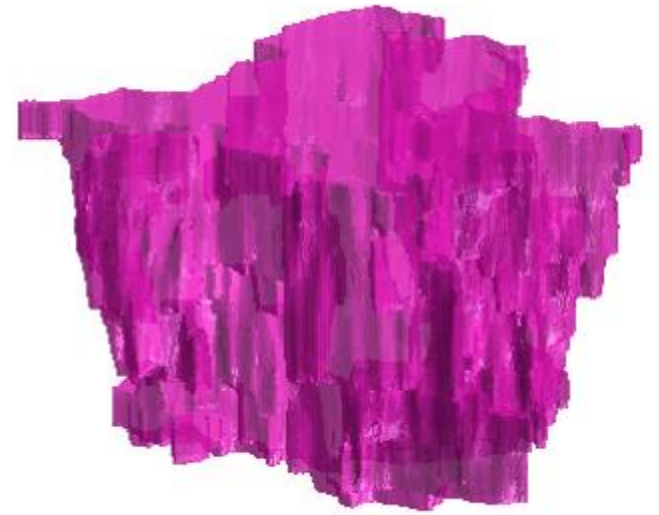
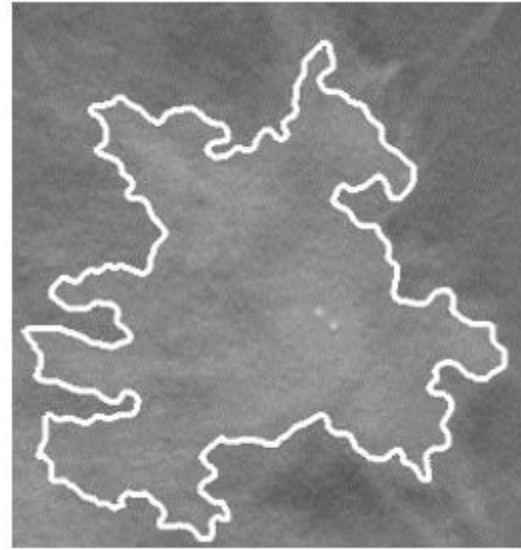
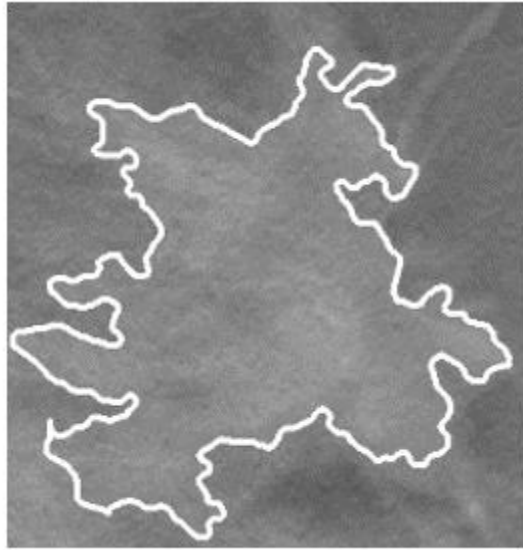
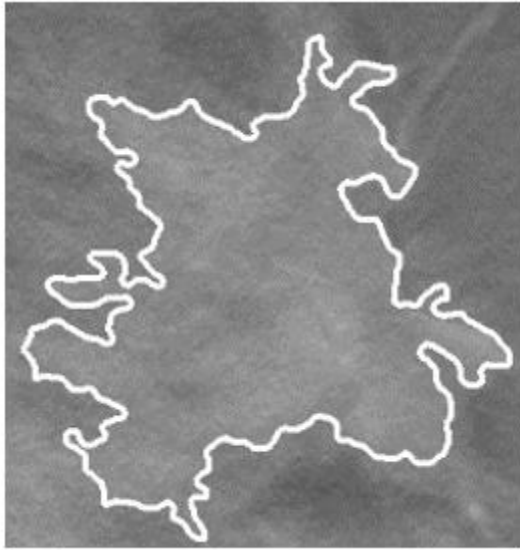


Segmented tumors

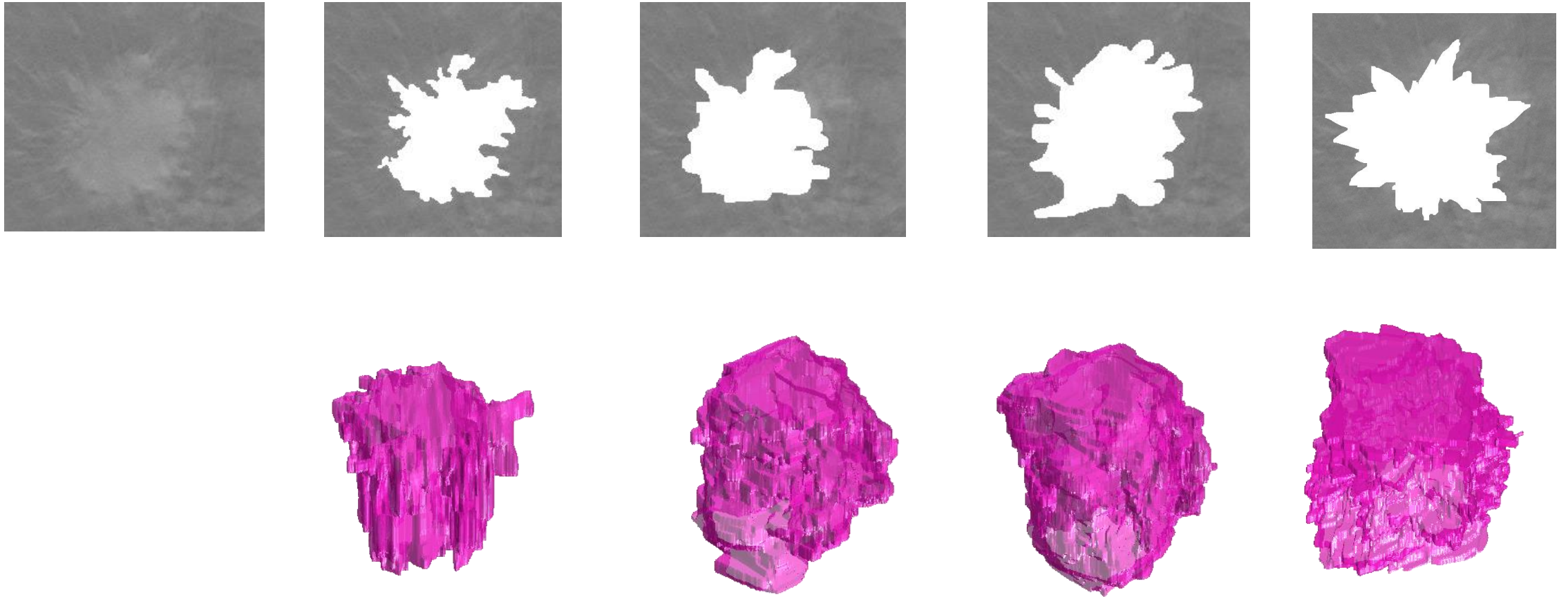
- ✓ More than sixty different 3D models of lesions with irregular shapes were created.
- ✓ Evaluated by experienced radiologists.



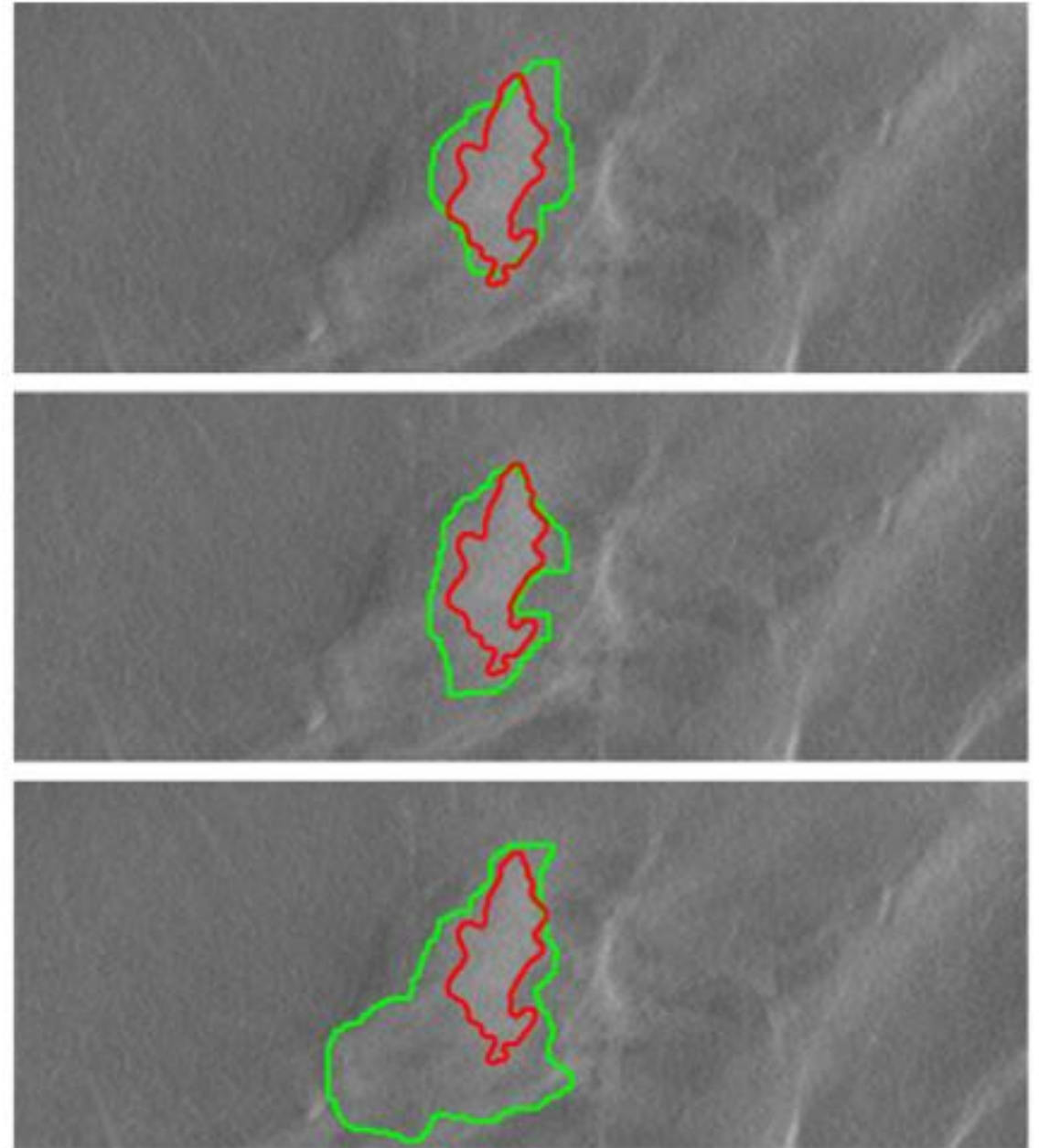
Segmentations



Comparison of segmented slices obtained by using the algorithm and outlined by three radiologists and the corresponding volumes



A comparison of segmented (on tomographic slices) shapes obtained with the algorithm (in red) and the three radiologists (green) who participated in the study



Future work

- Correct the shape in z direction
- Classification and full characterization of segmented abnormalities
- Generation of more spiculated in shape abnormalities
- Radiomics with the use of deep learning combined with machine learning
- Generation of new abnormality types from the existing models



Paolo

Methods

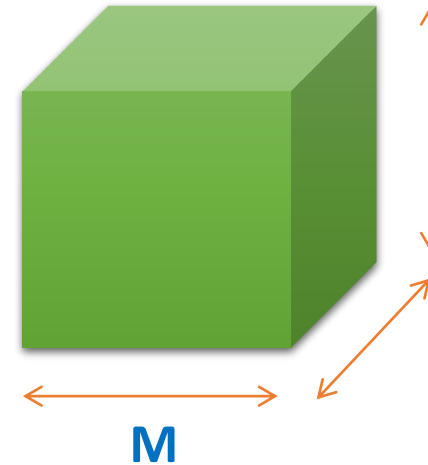
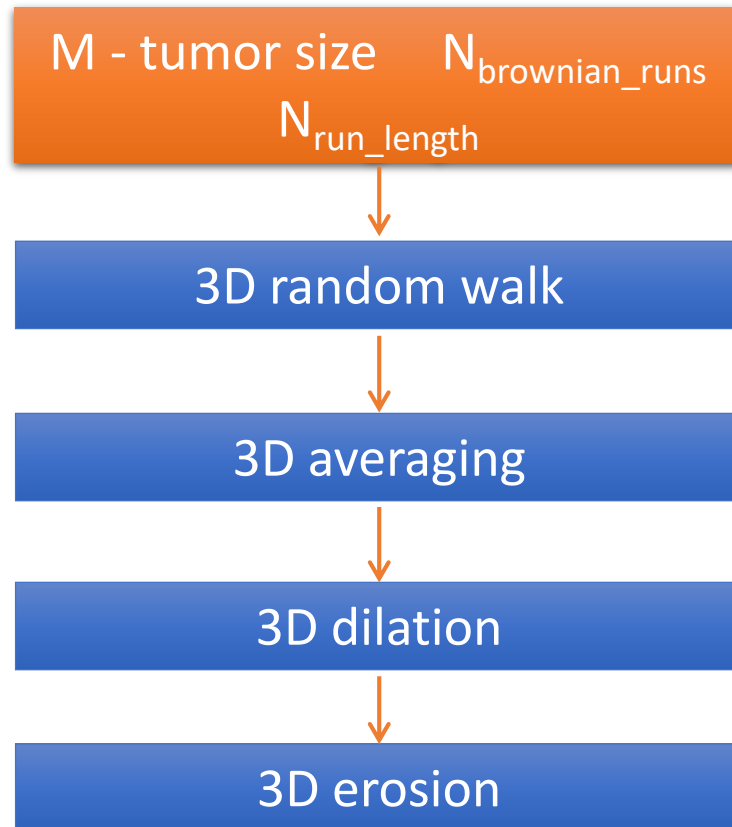
Segmented lesions

- Sources
- Algorithms
- Evaluation
- Storage

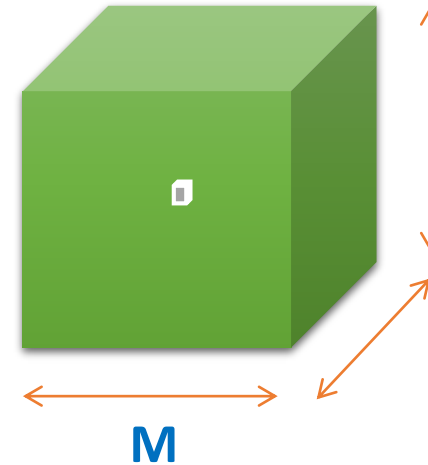
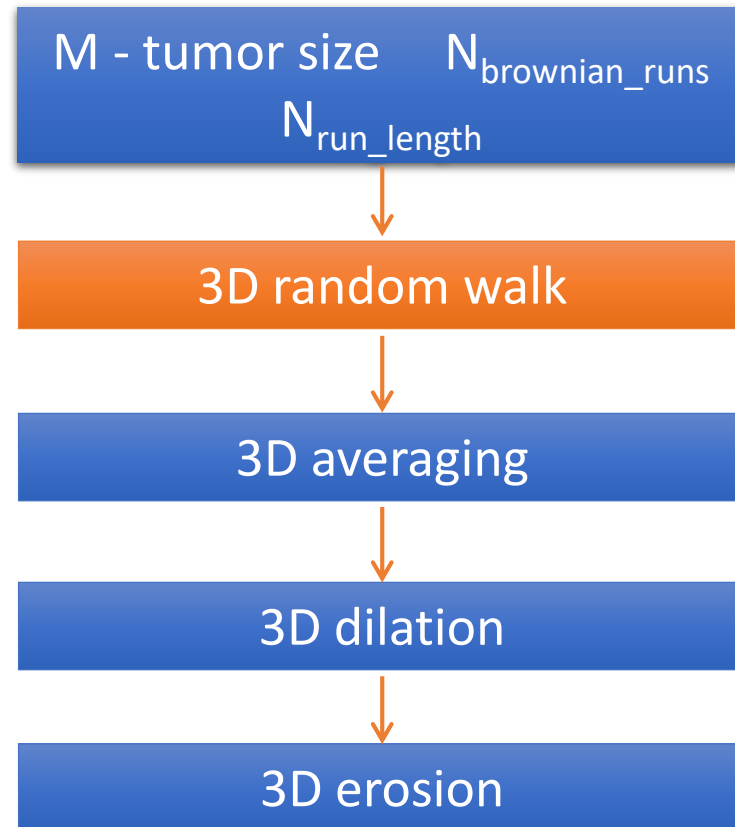
Modelled lesions

- Mathematical algorithms
- Evaluation
- Storage

Mathematically modelled lesions - irregular masses



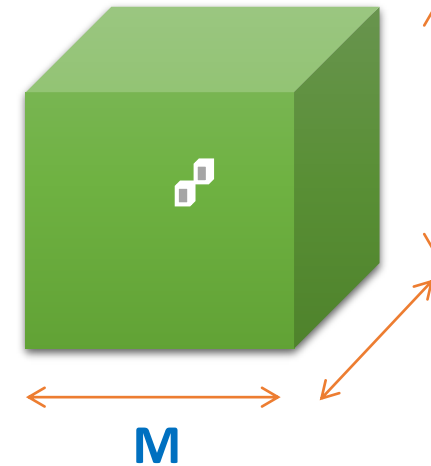
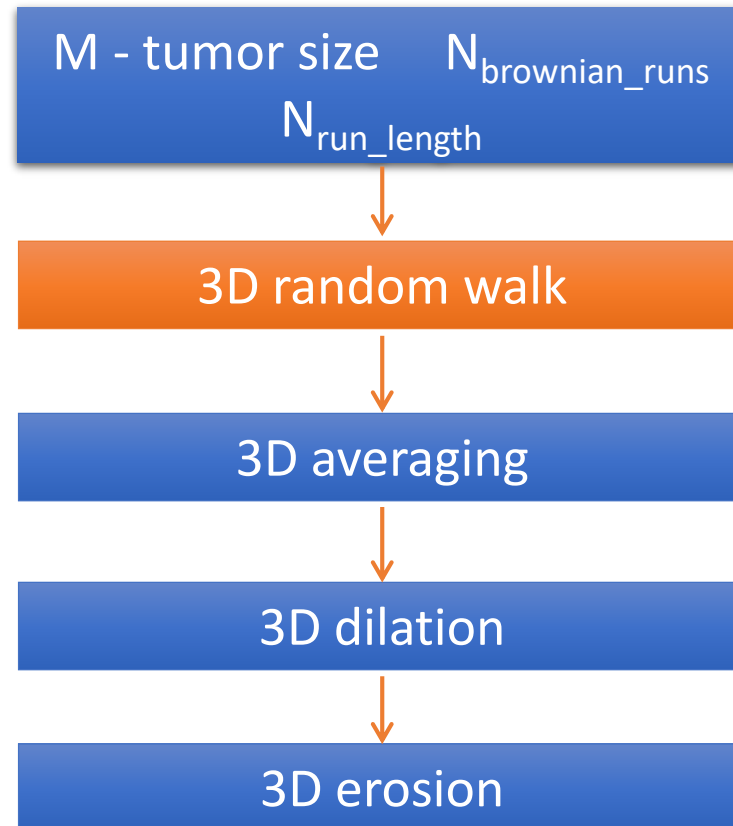
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

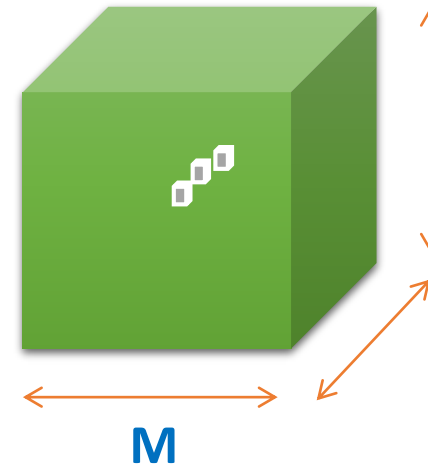
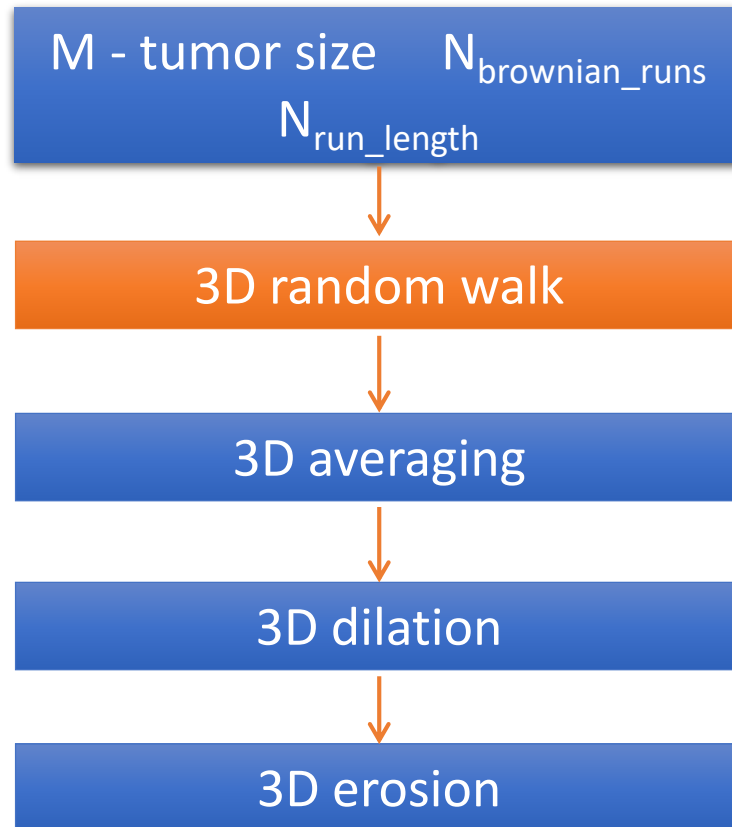
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

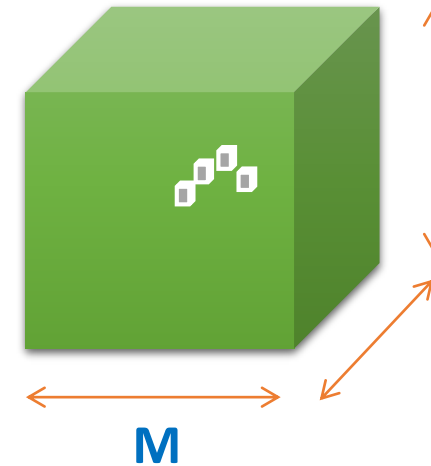
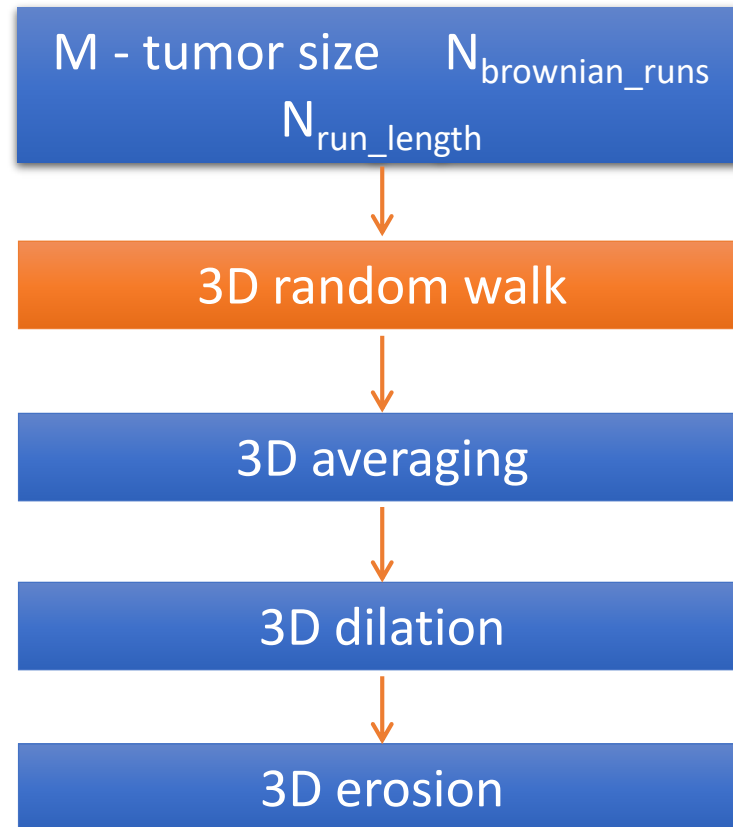
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

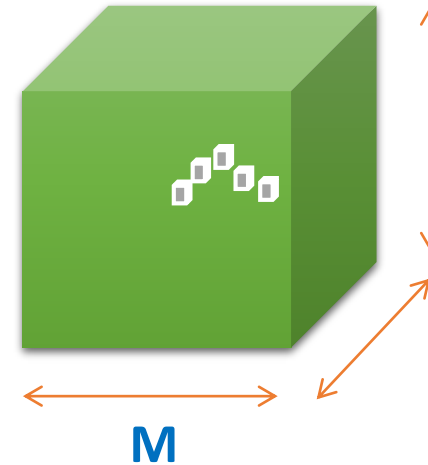
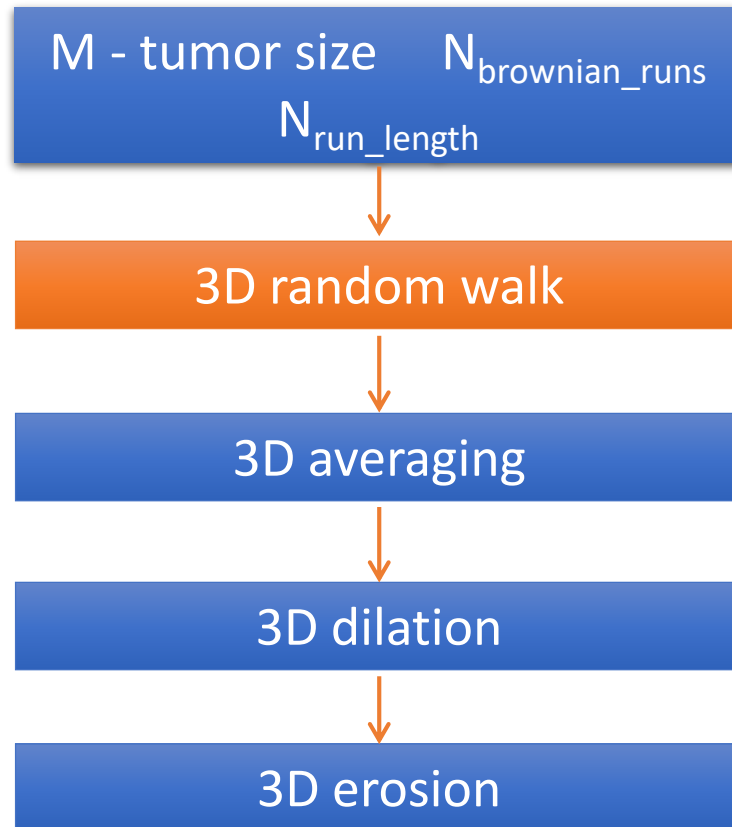
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

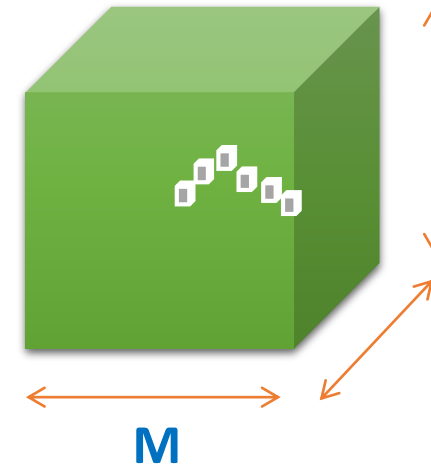
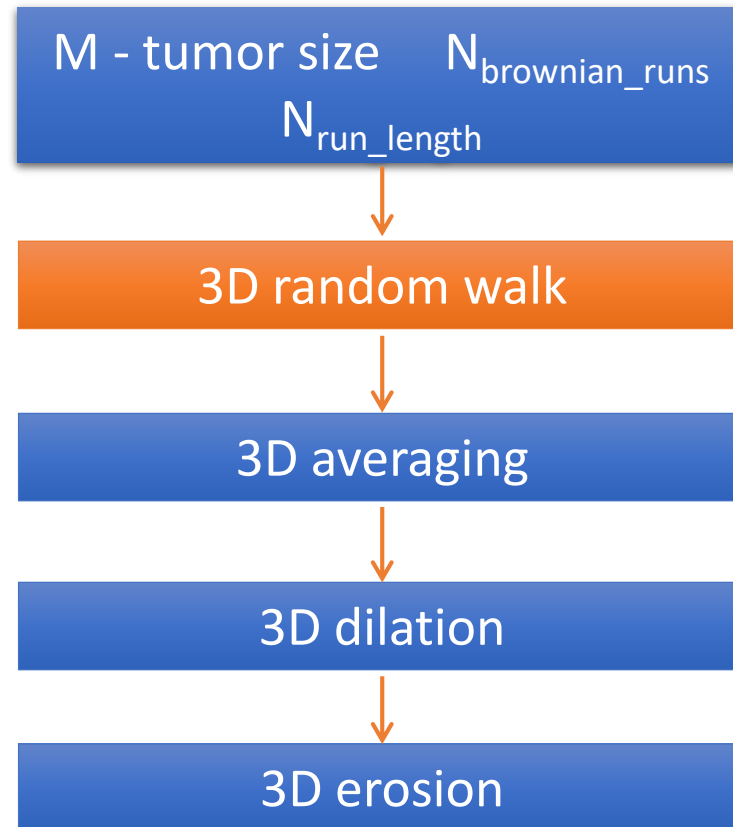
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

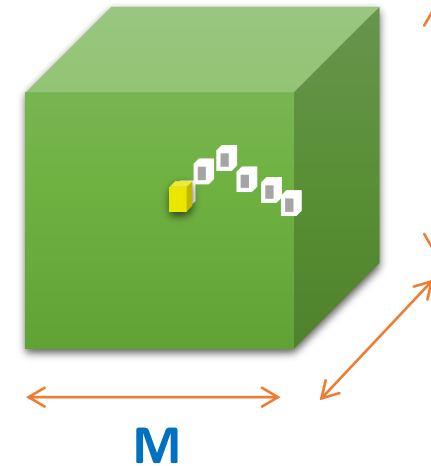
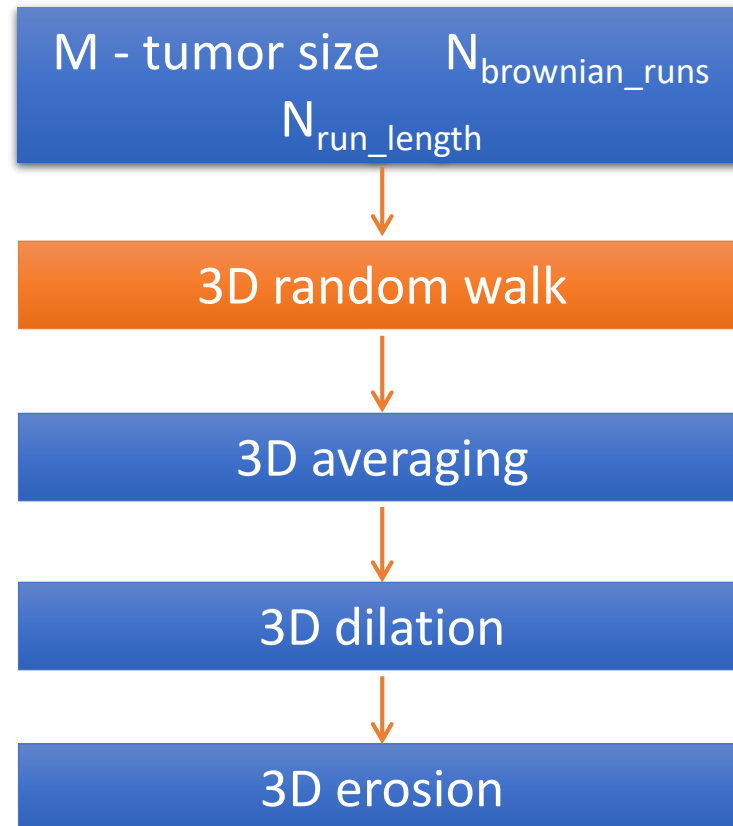
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

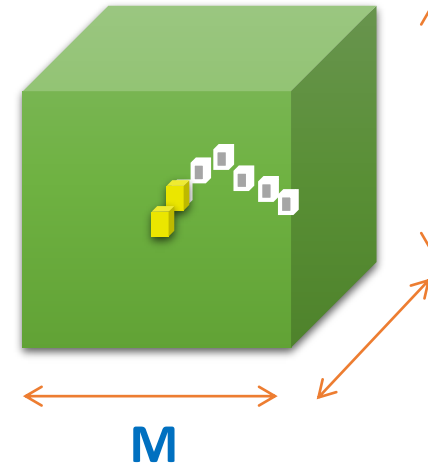
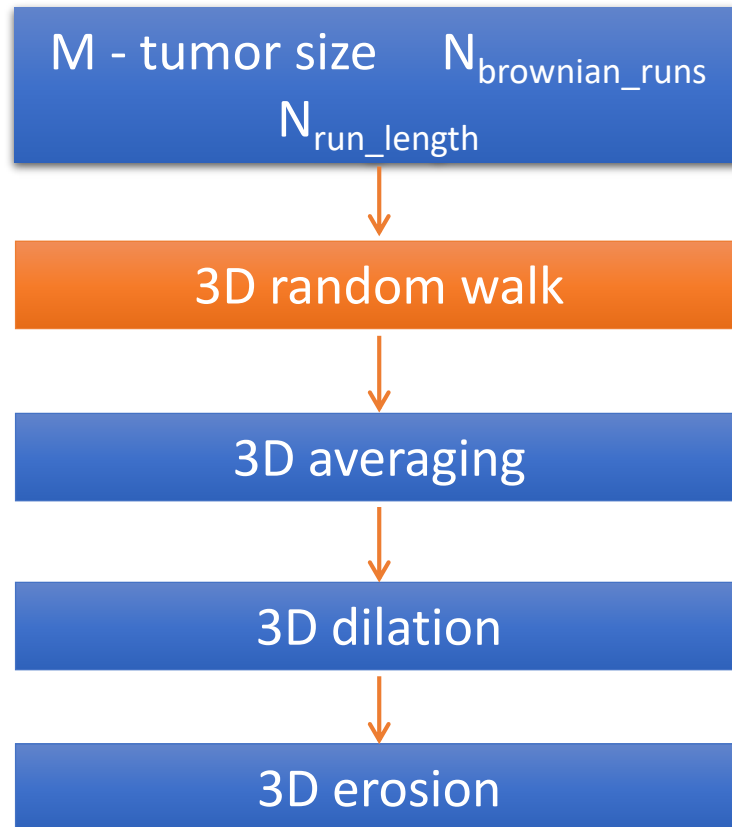
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

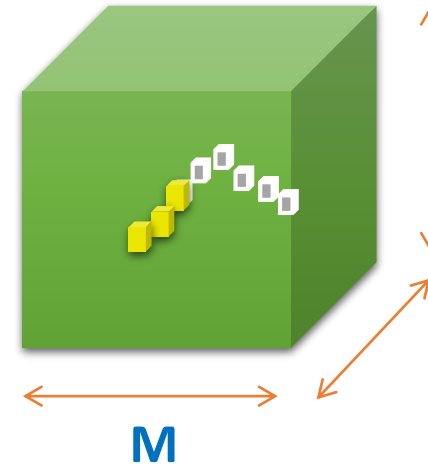
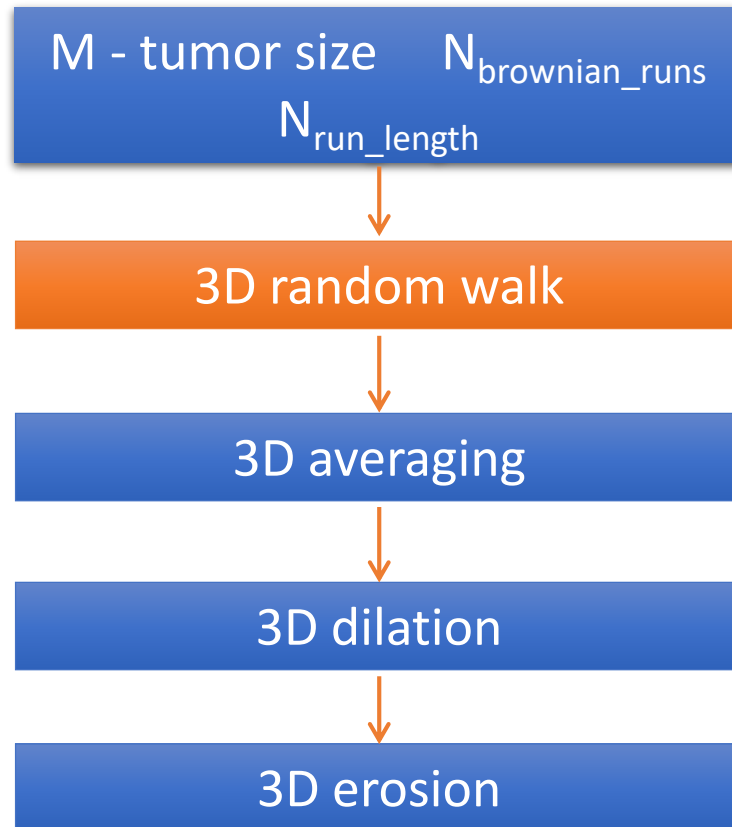
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

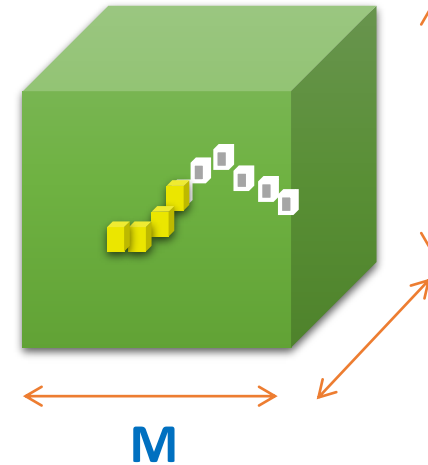
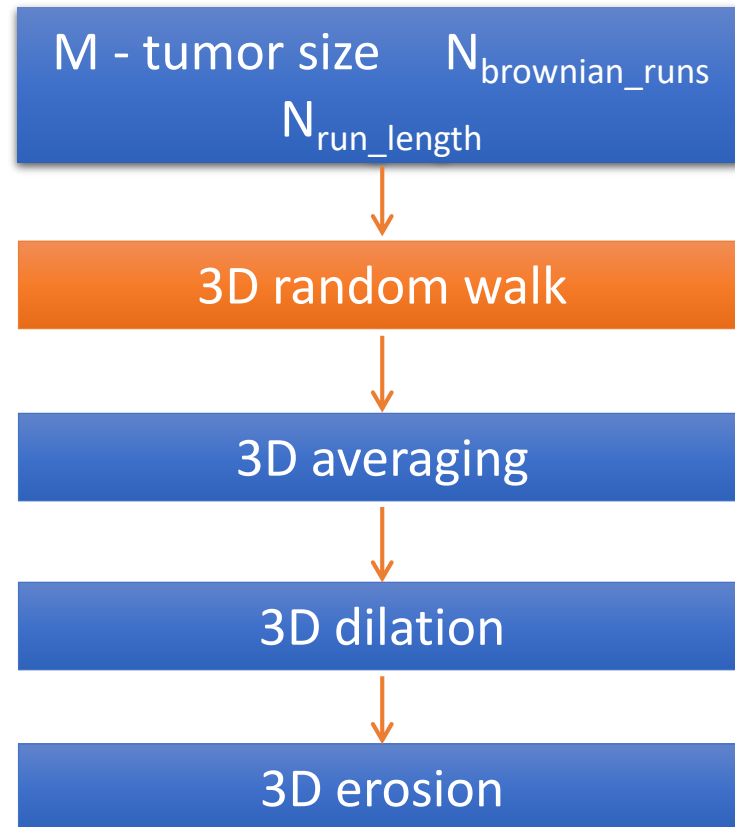
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

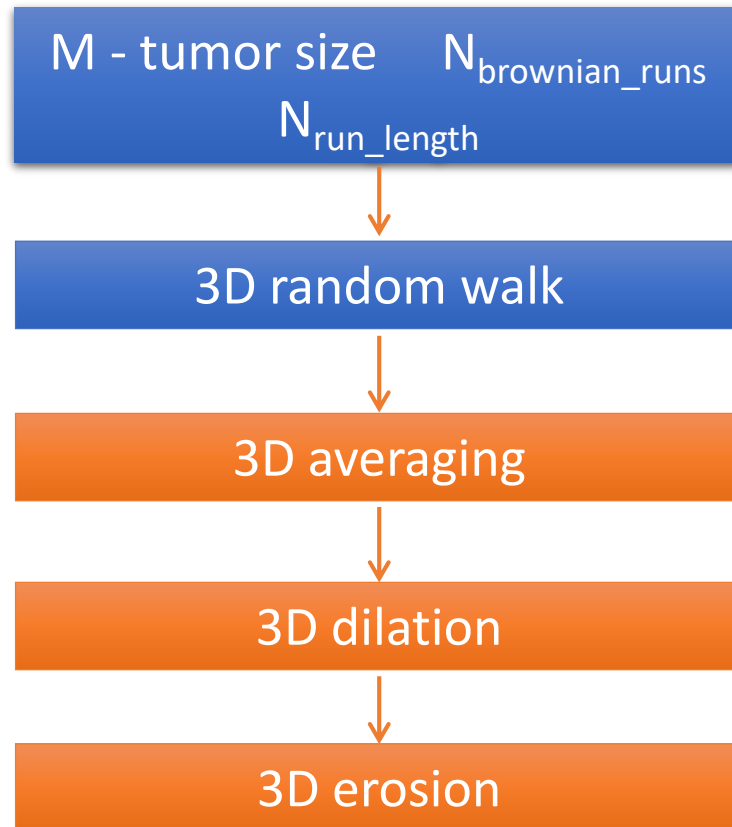
Mathematically modelled lesions - irregular masses



Modelling is based on random walk is a random process consisting of a sequence of discrete steps of fixed length.

At each step, the walk goes randomly a unit distance along one of the neighbor pixels.

Mathematically modelled lesions - irregular masses

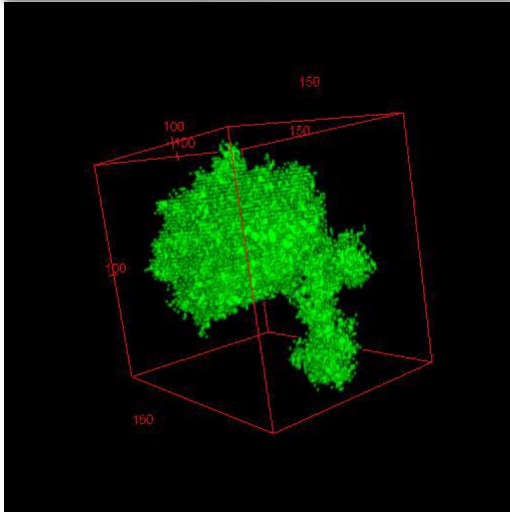


Models

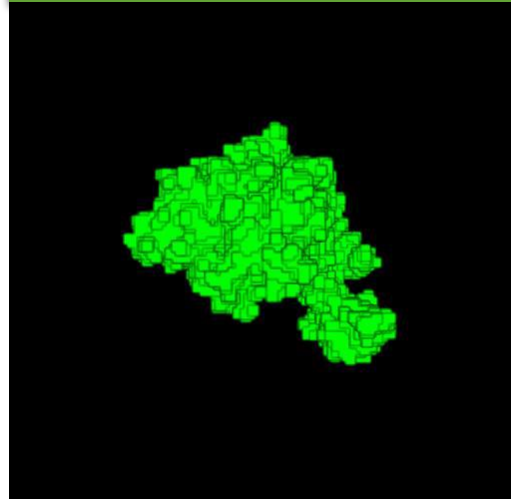
$M = 200$

$N_{\text{brownian_runs}} = 300$

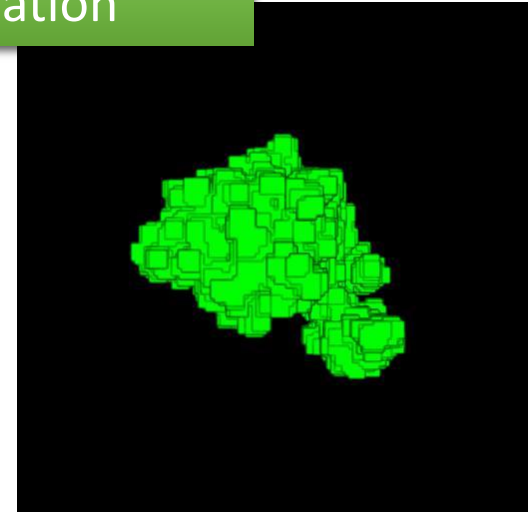
$N_{\text{run_length}} = 200$



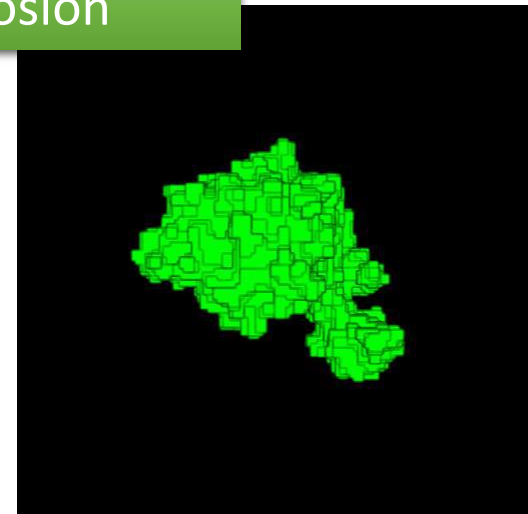
3D averaging



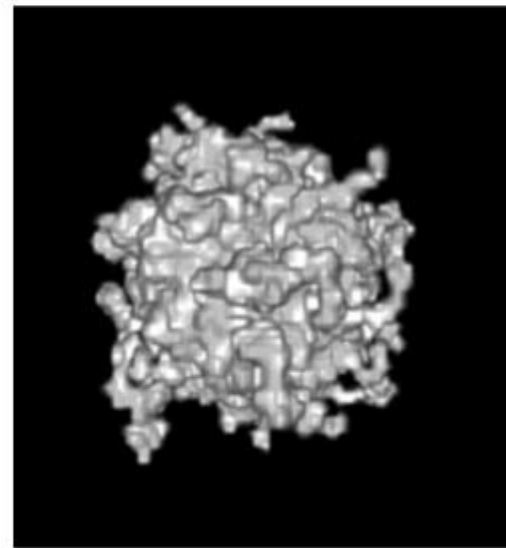
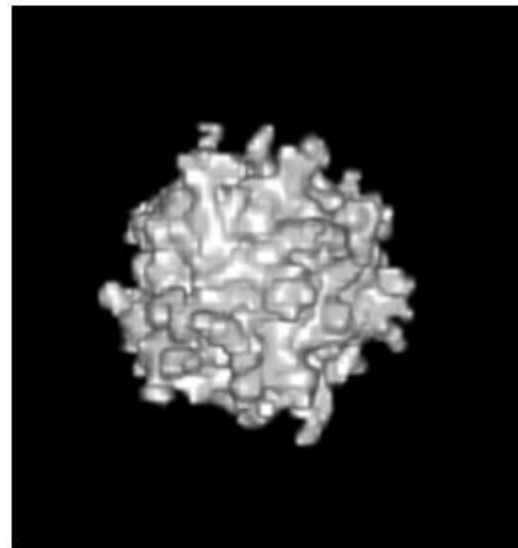
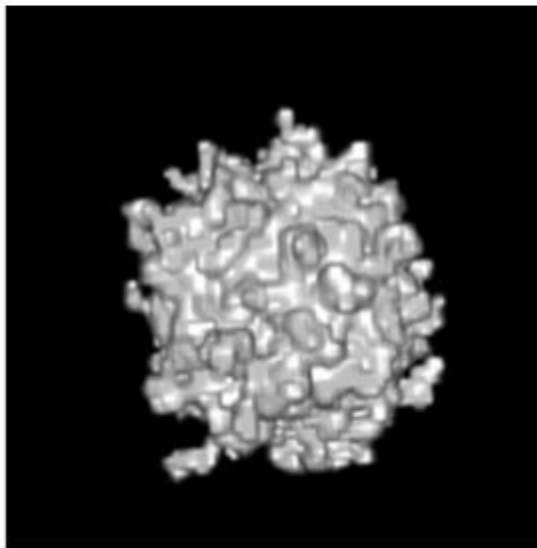
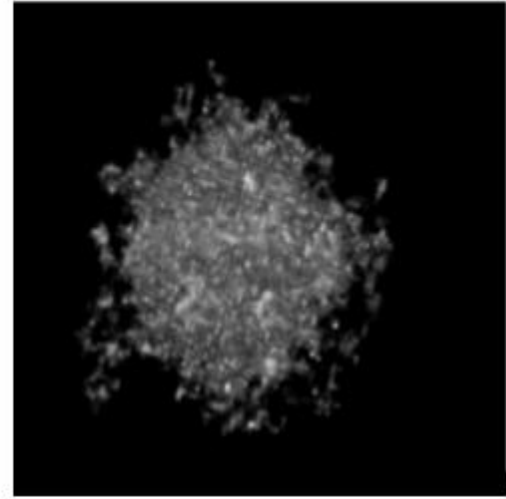
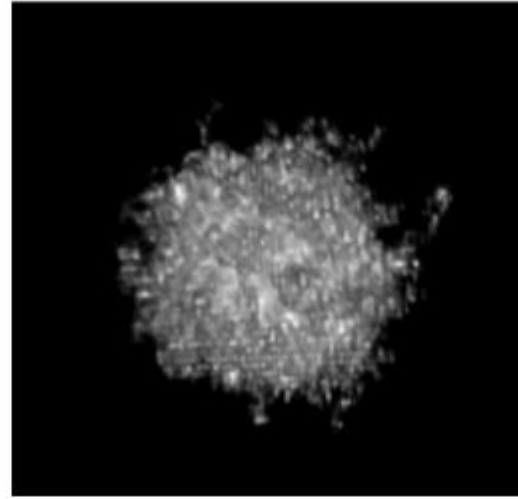
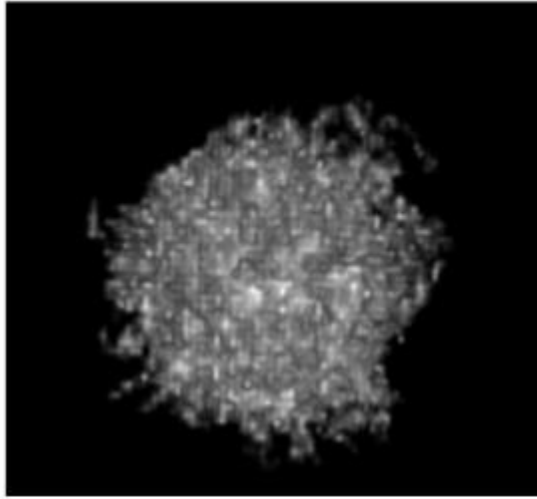
3D dilation



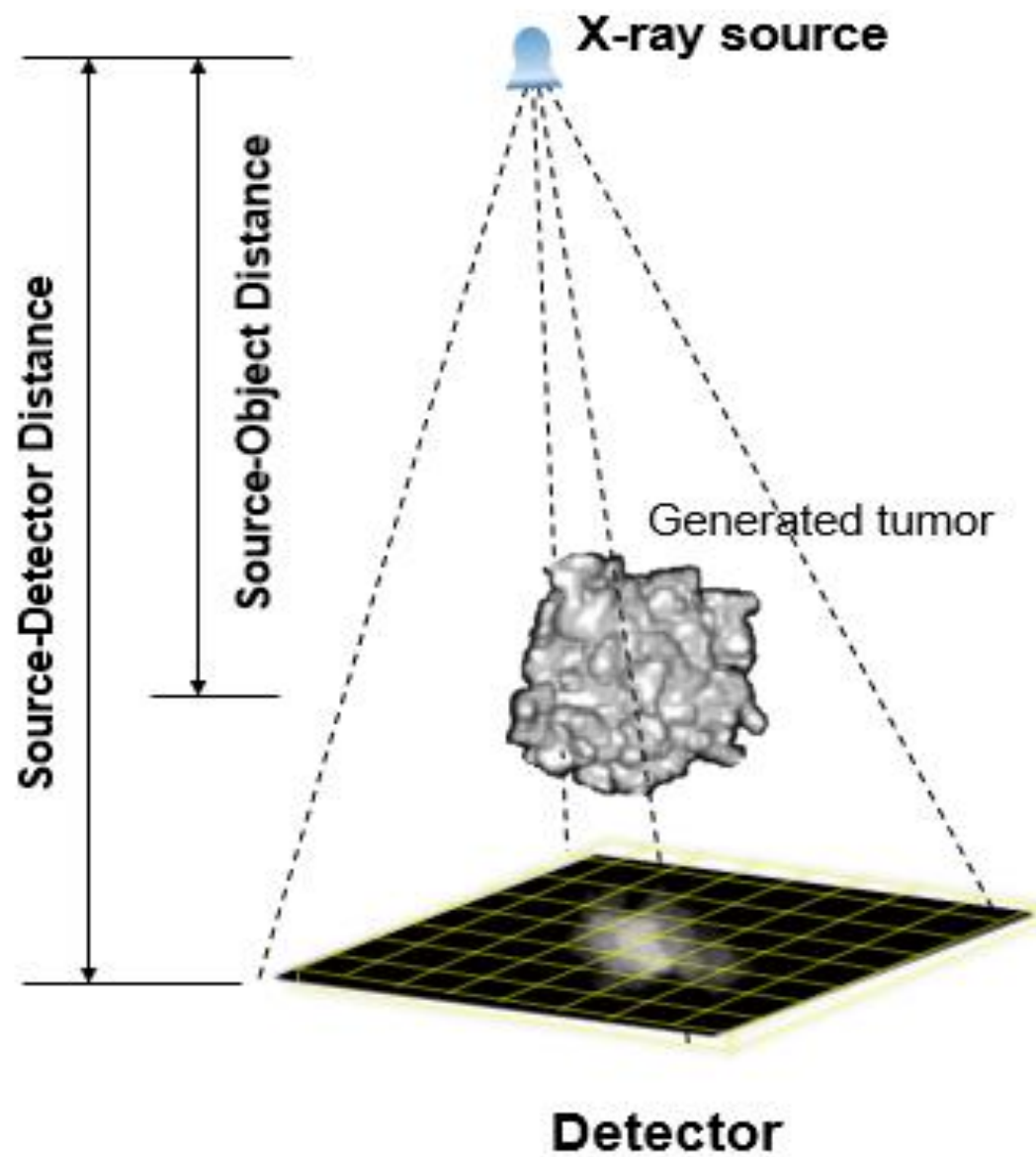
3D erosion

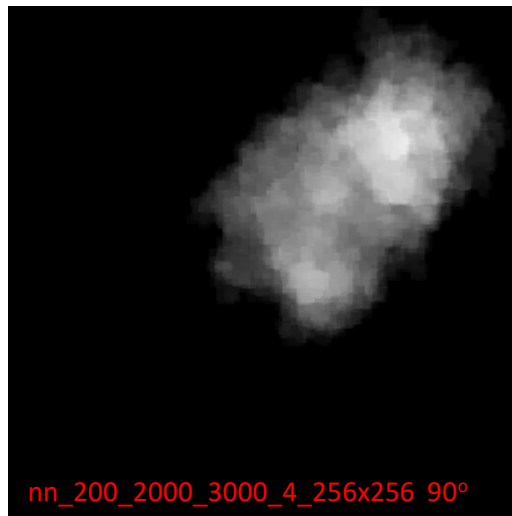
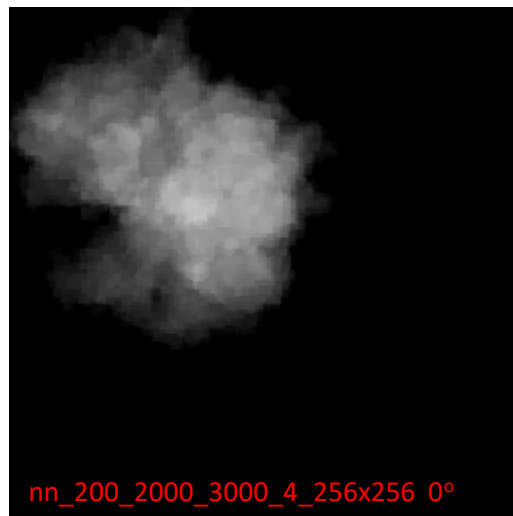
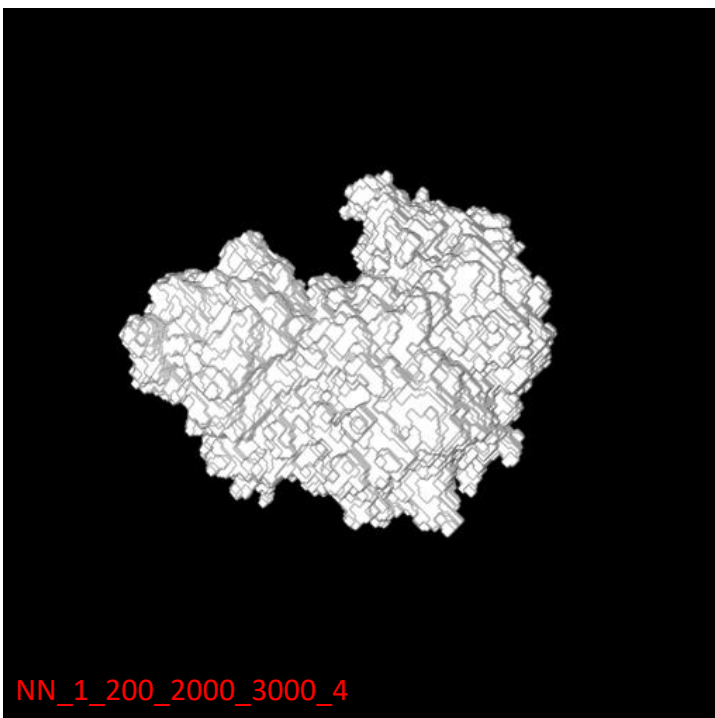
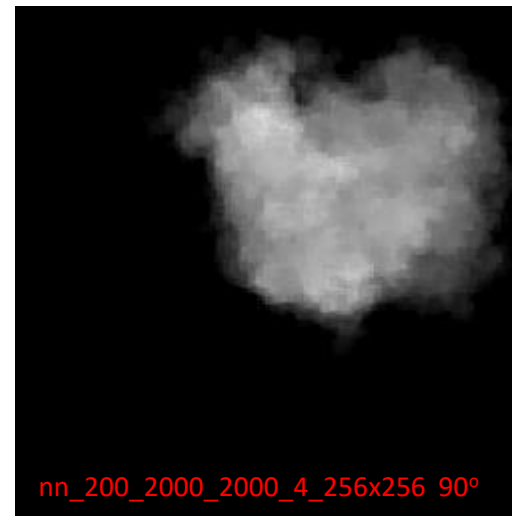
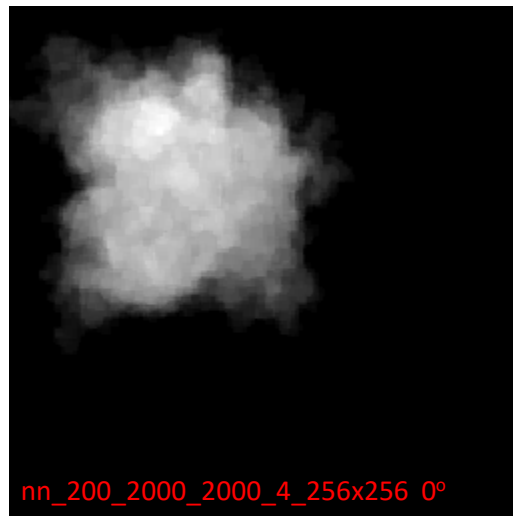
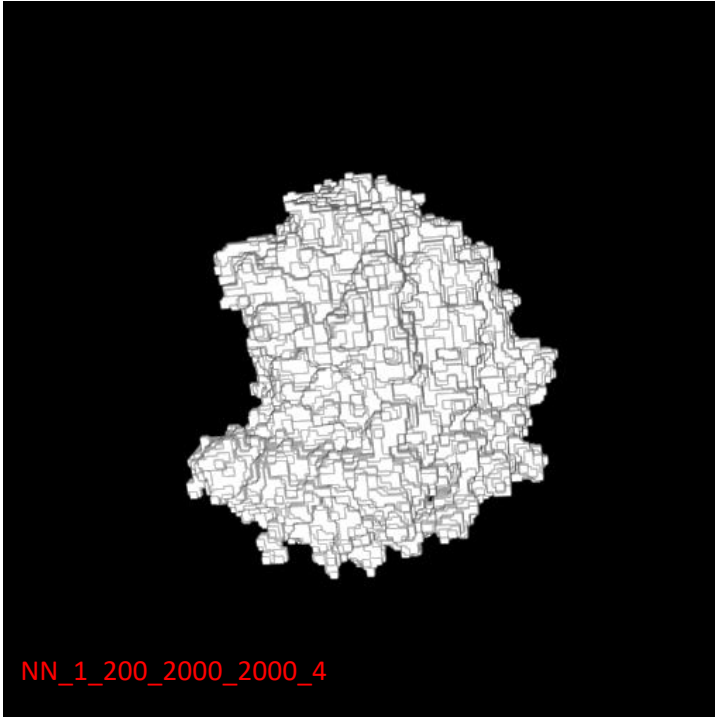


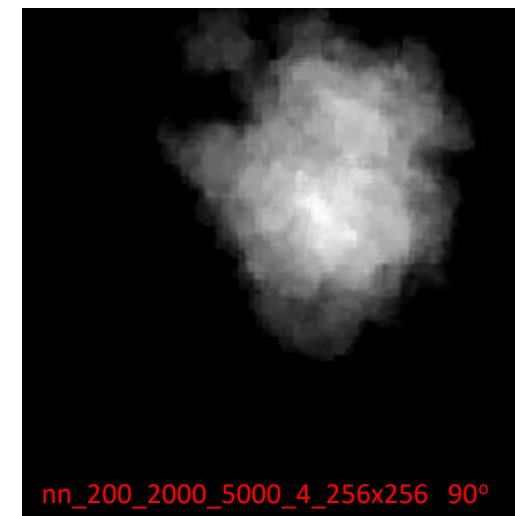
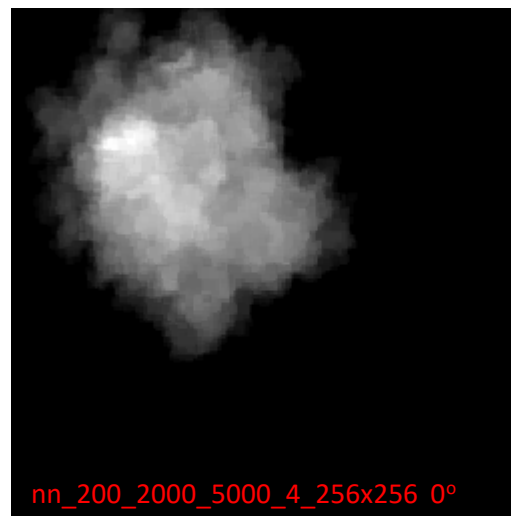
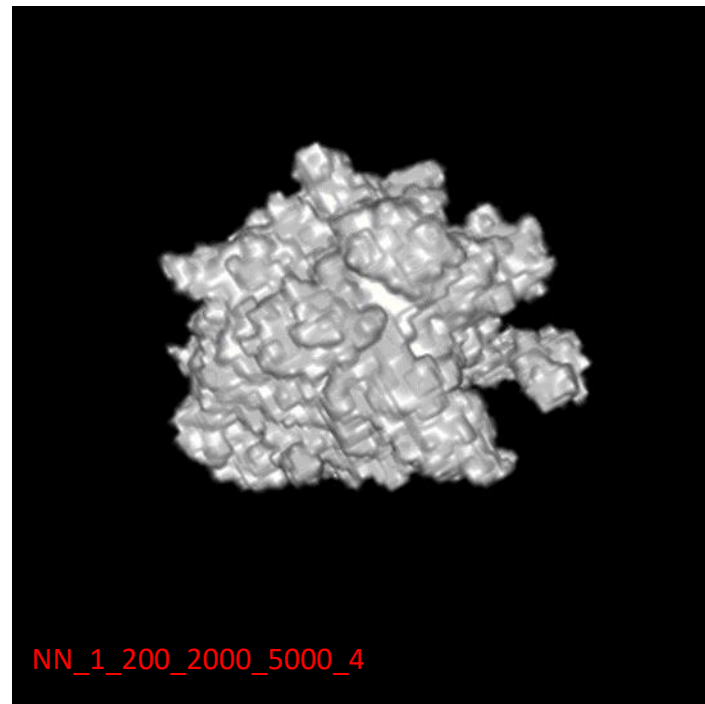
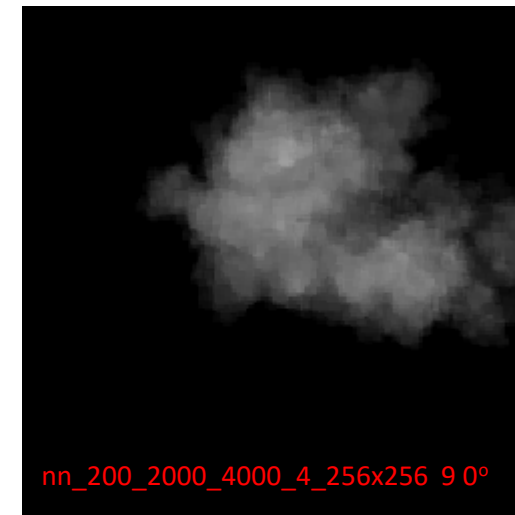
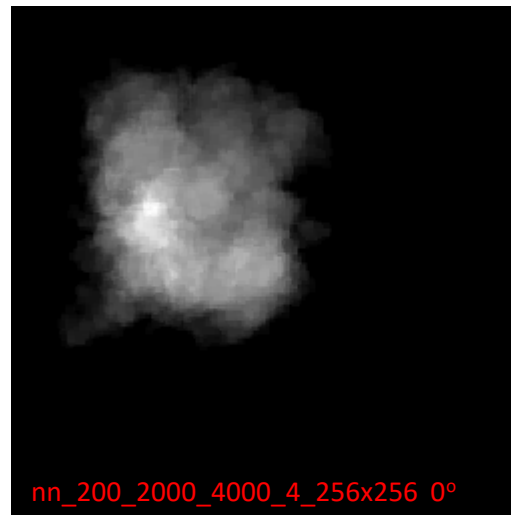
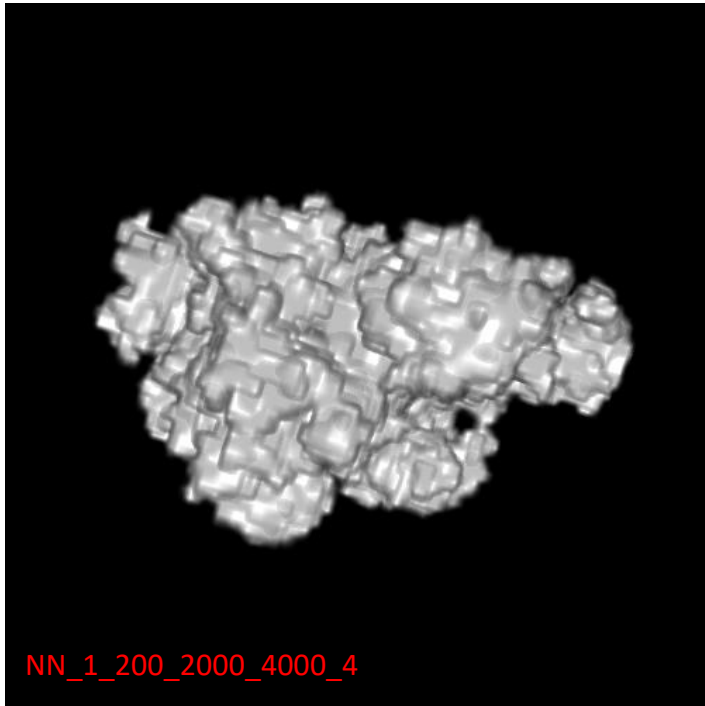
Models

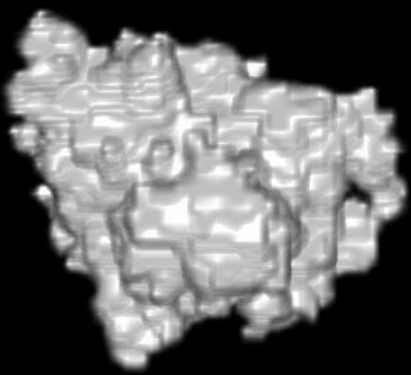


Evaluation









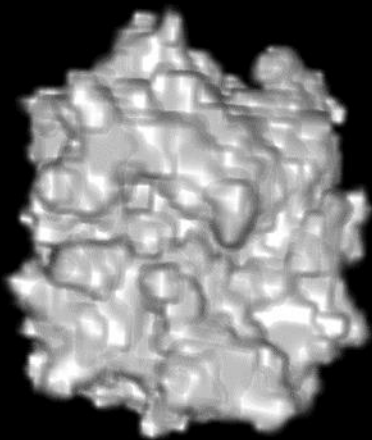
NN_1_500_500_1000_4



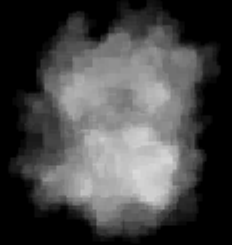
nn_500_500_1000_4_256x256 0°



nn_500_500_1000_4_256x256 90°



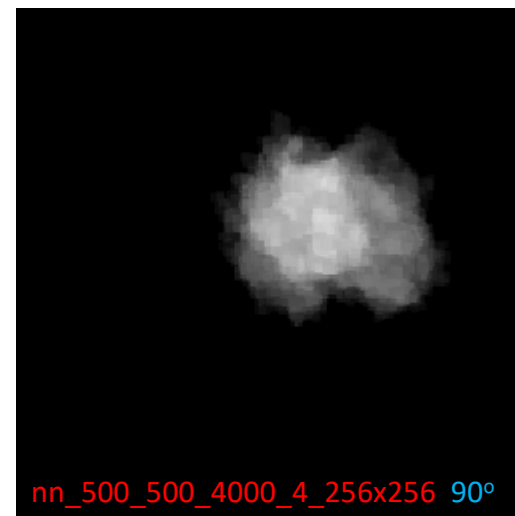
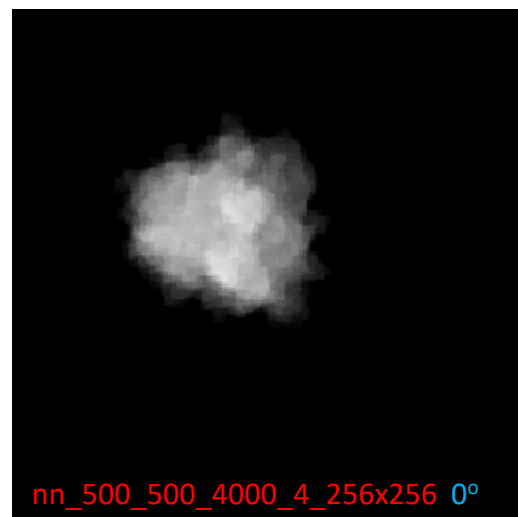
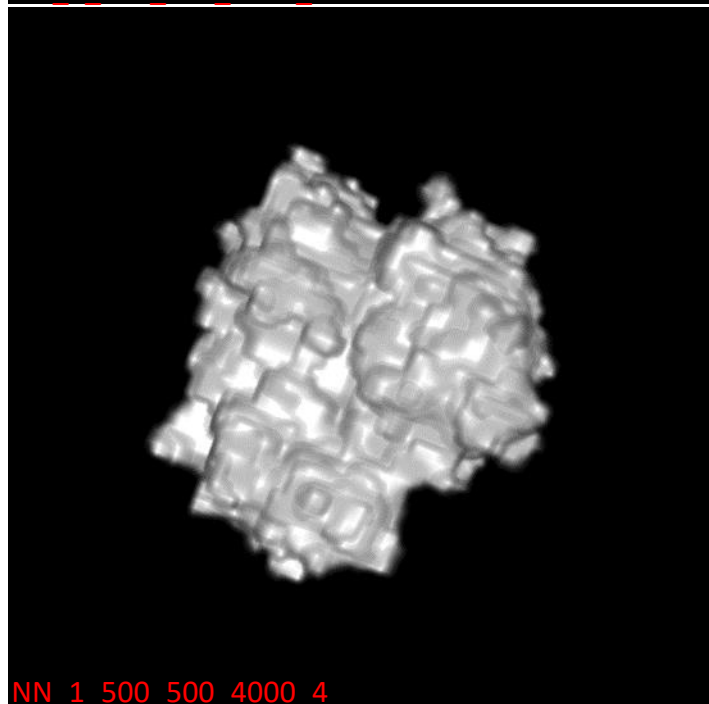
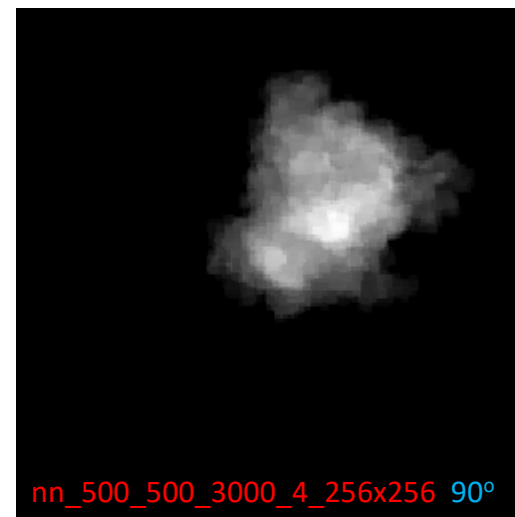
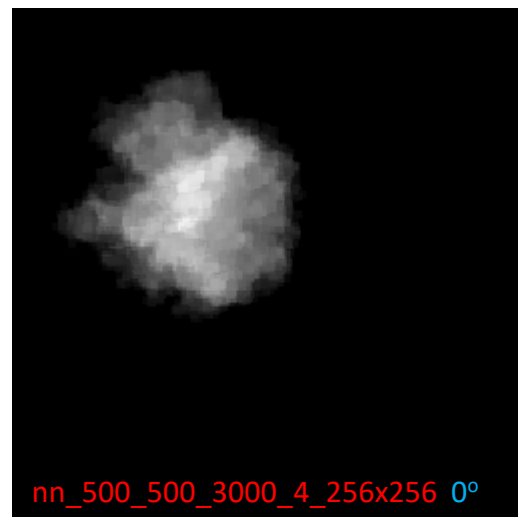
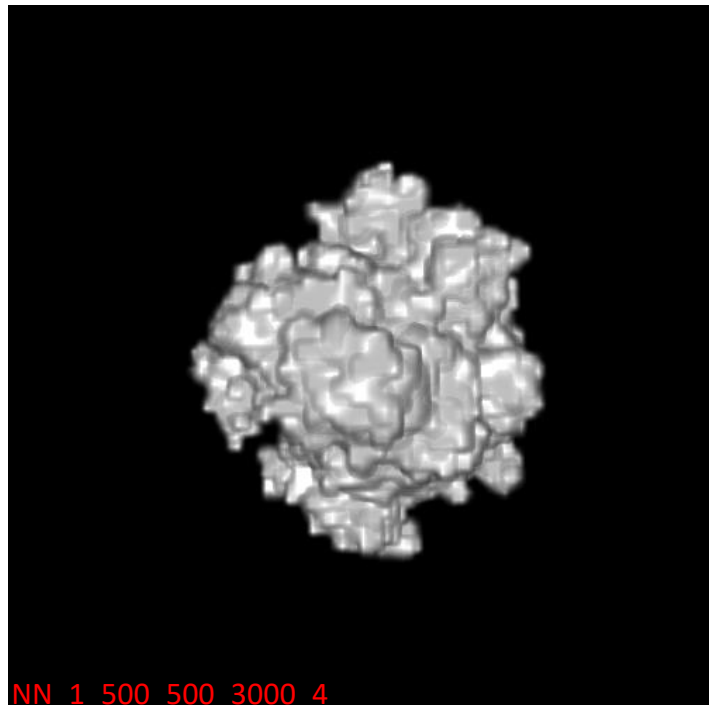
NN_1_500_500_2000_4

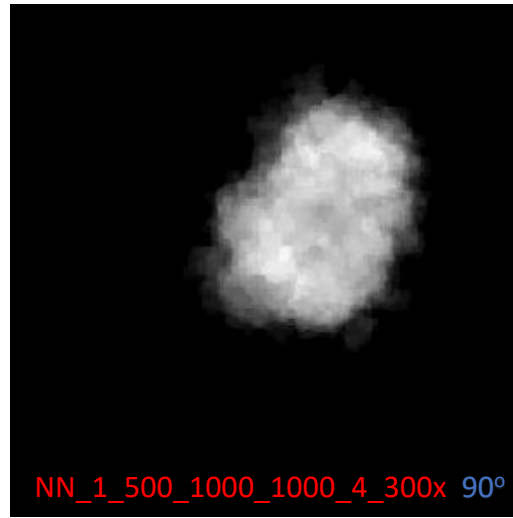
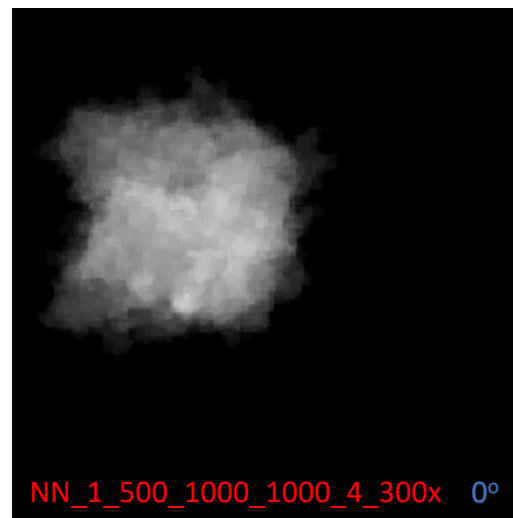
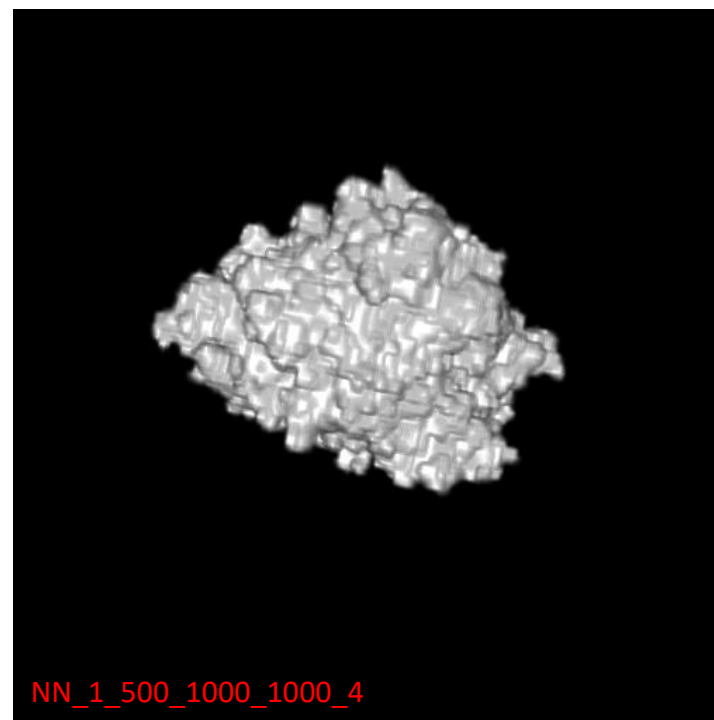
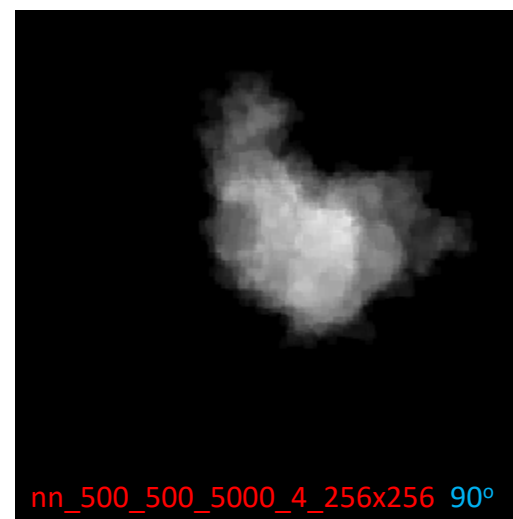
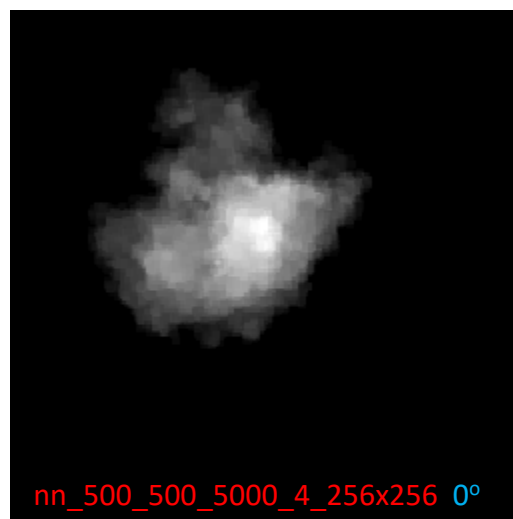
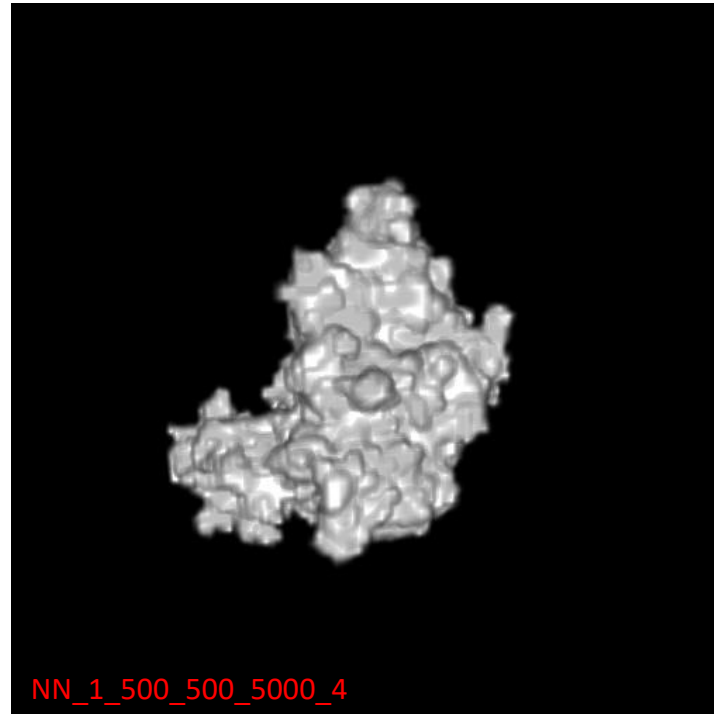


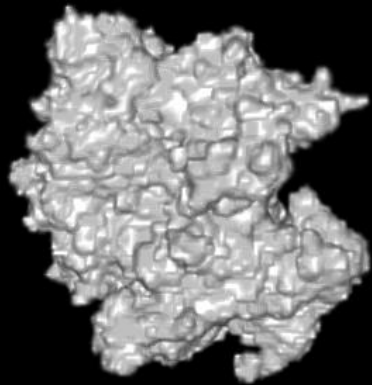
nn_500_500_2000_4_256x256 0°



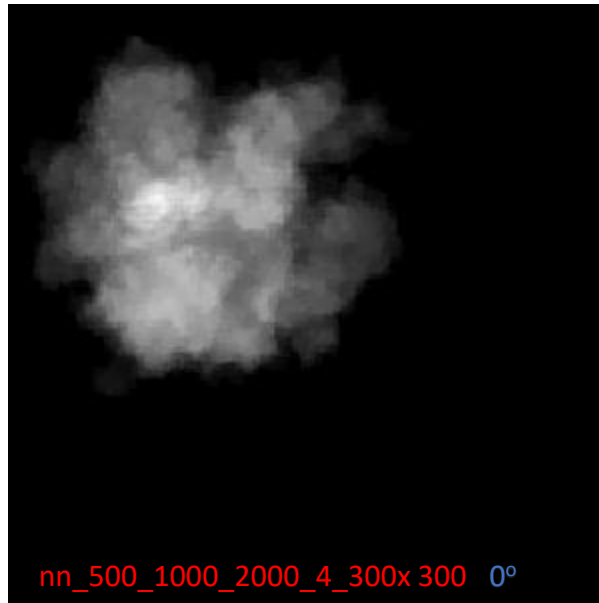
nn_500_500_2000_4_256x256 90°



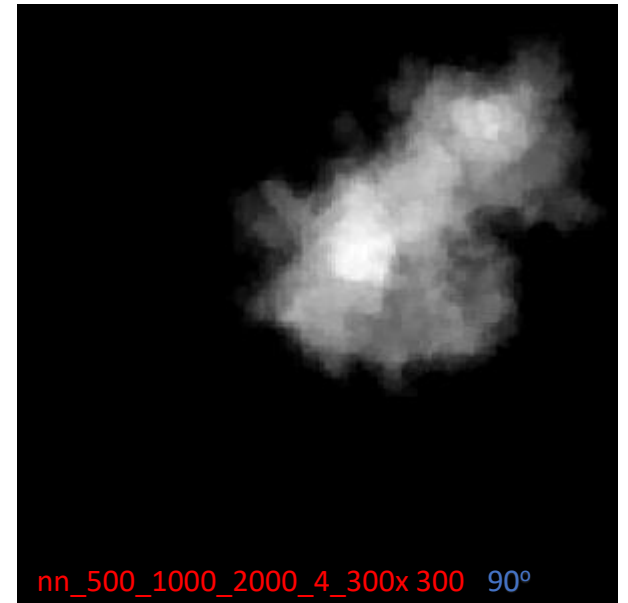




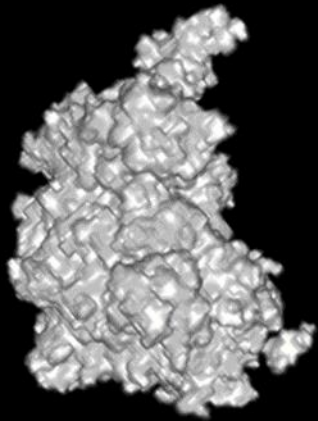
NN_1_500_1000_2000_4



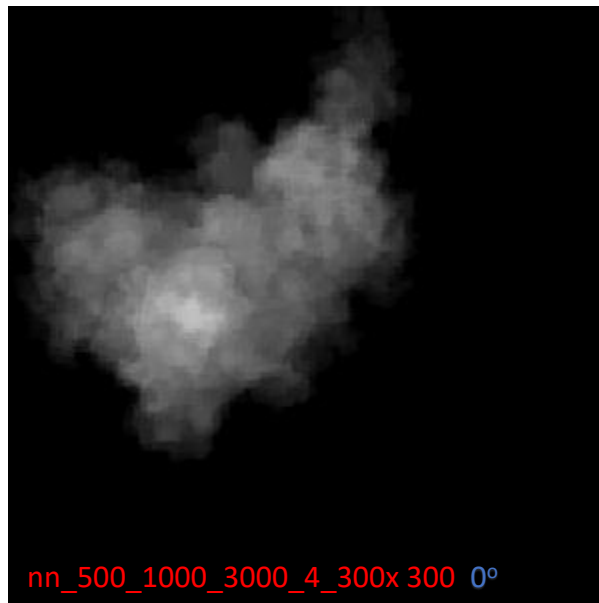
nn_500_1000_2000_4_300x300 0°



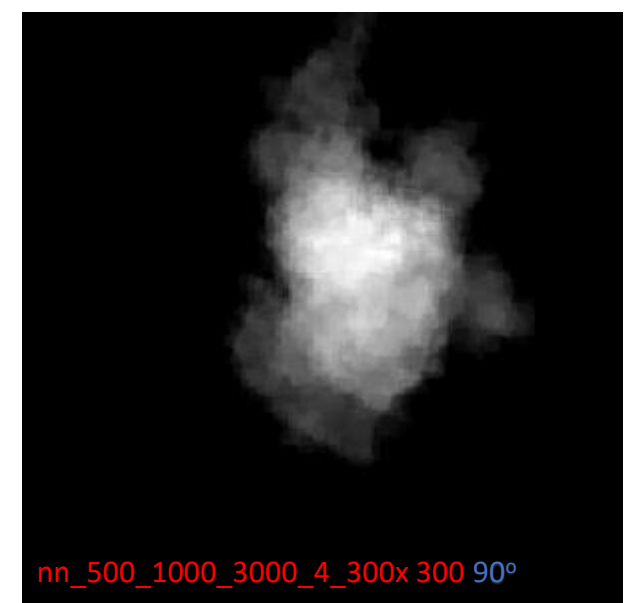
nn_500_1000_2000_4_300x300 90°



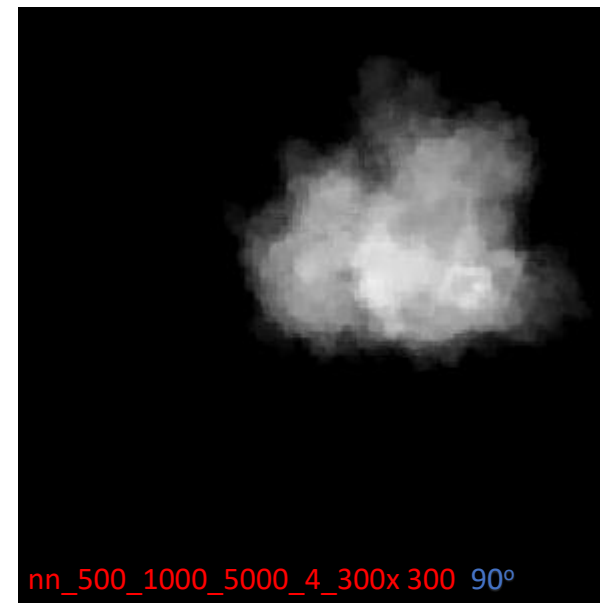
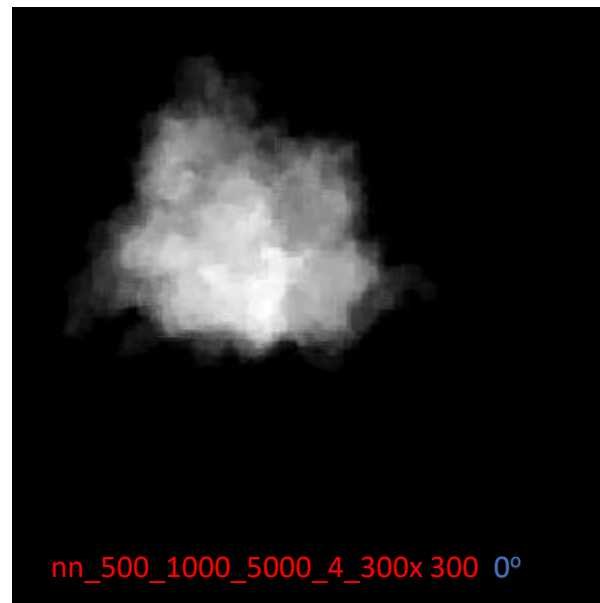
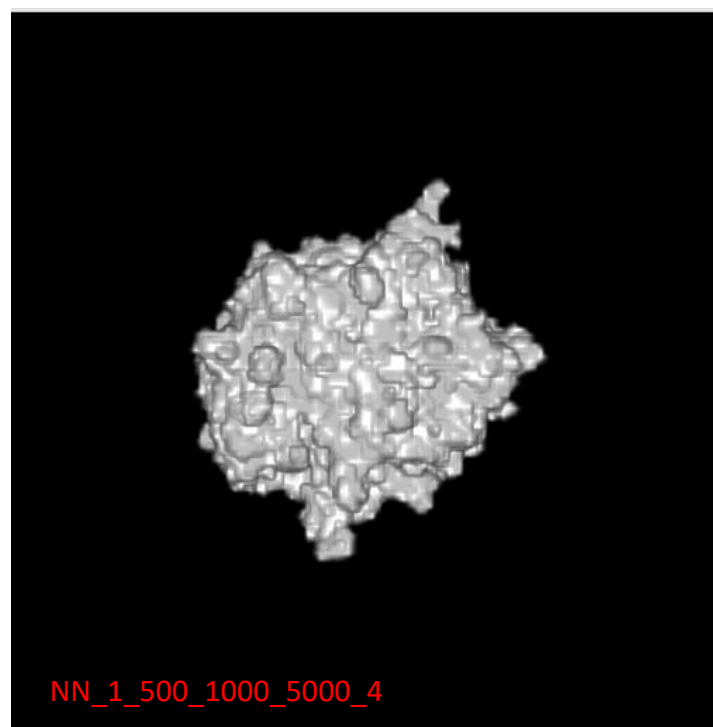
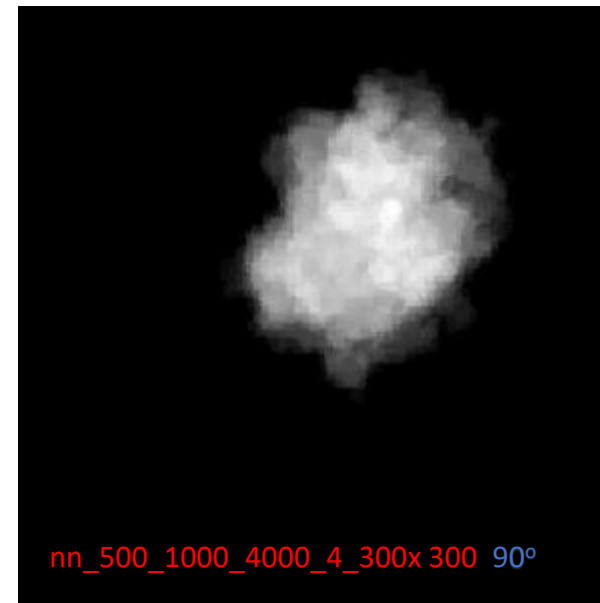
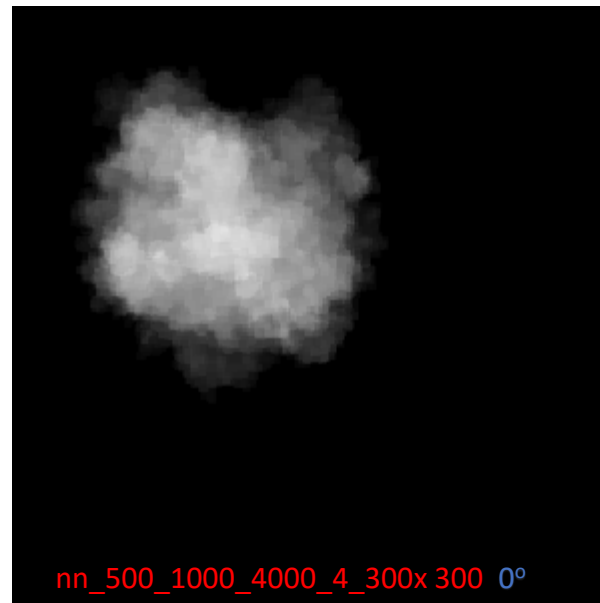
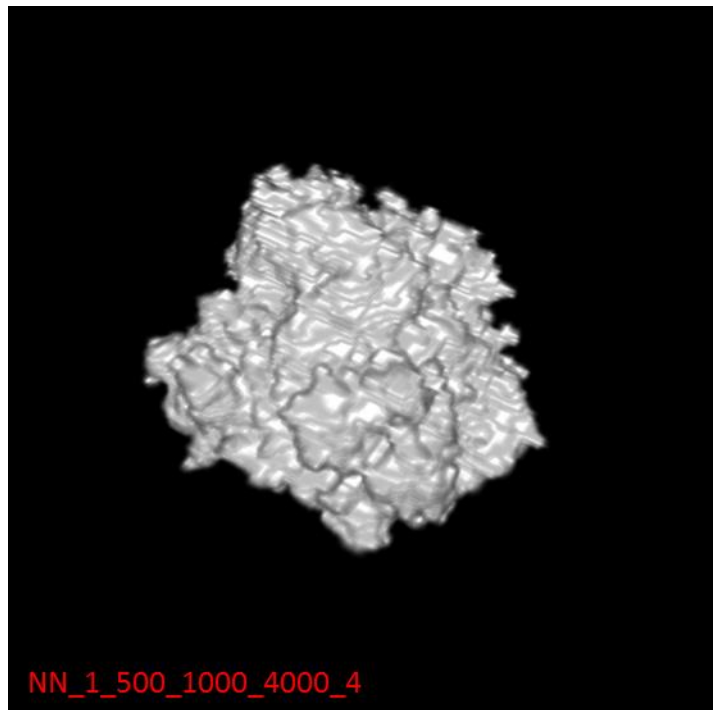
NN_1_500_1000_3000_4

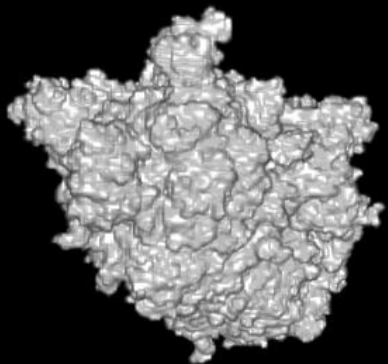


nn_500_1000_3000_4_300x300 0°

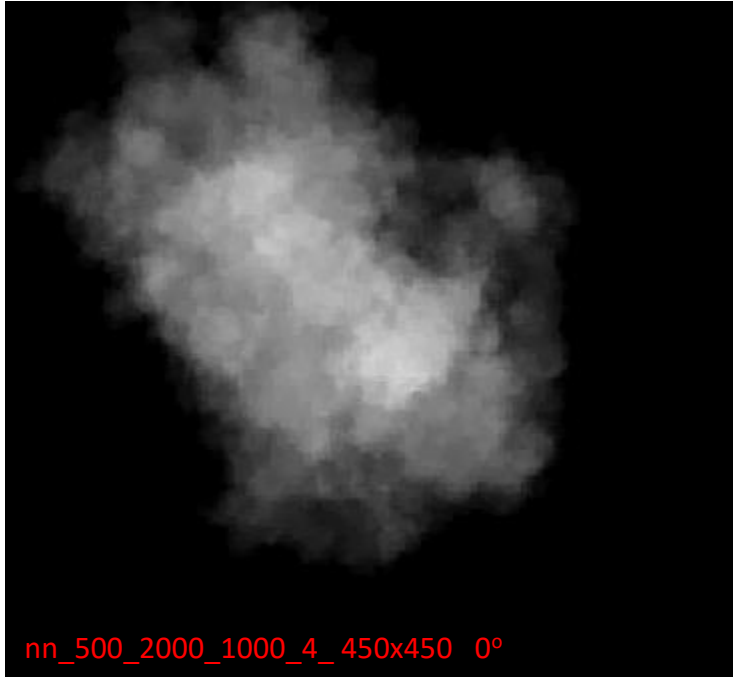


nn_500_1000_3000_4_300x300 90°

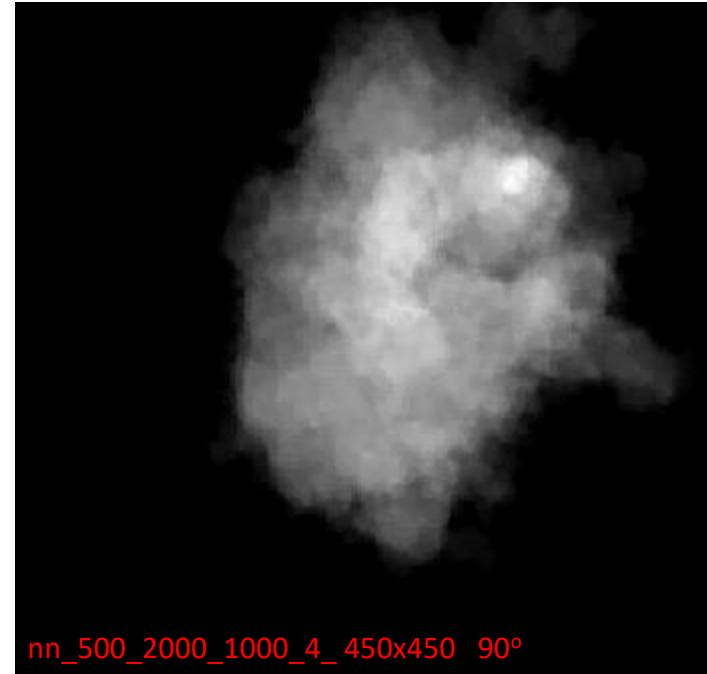




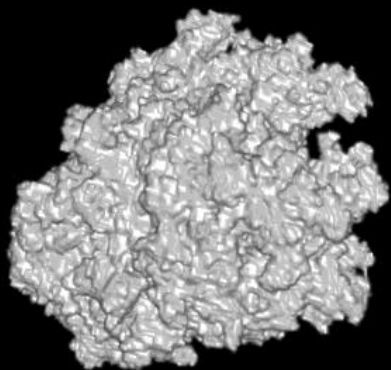
NN_1_500_2000_1000_4



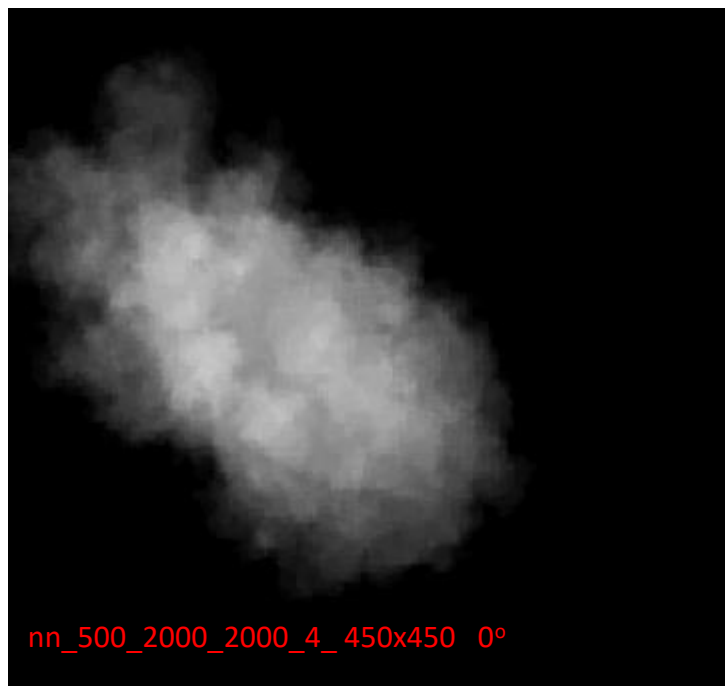
nn_500_2000_1000_4_450x450 0°



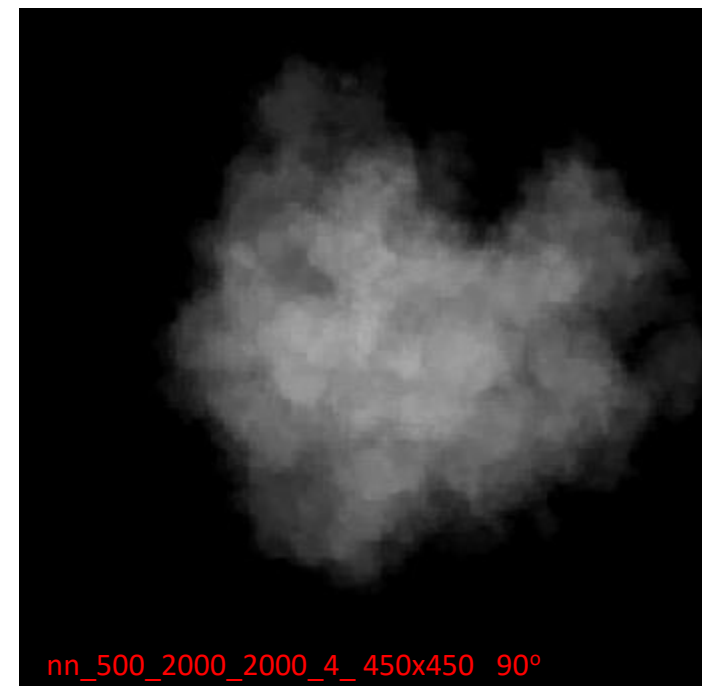
nn_500_2000_1000_4_450x450 90°



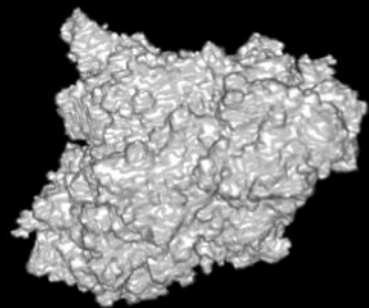
NN_1_500_2000_2000_4



nn_500_2000_2000_4_450x450 0°



nn_500_2000_2000_4_450x450 90°



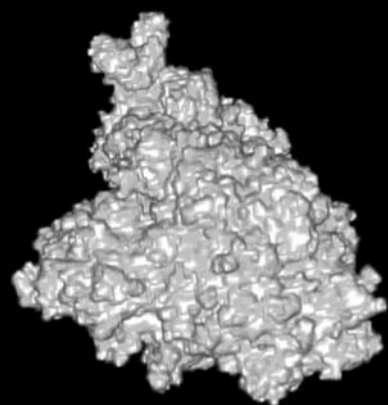
NN_1_500_2000_3000_4



nn_500_2000_3000_4_450x450 0°



nn_500_2000_3000_4_450x450 90°



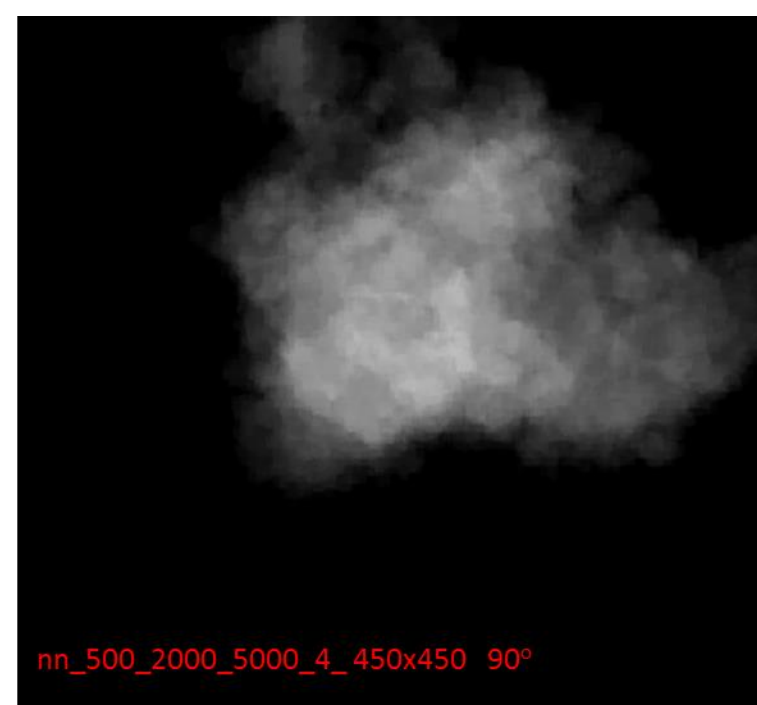
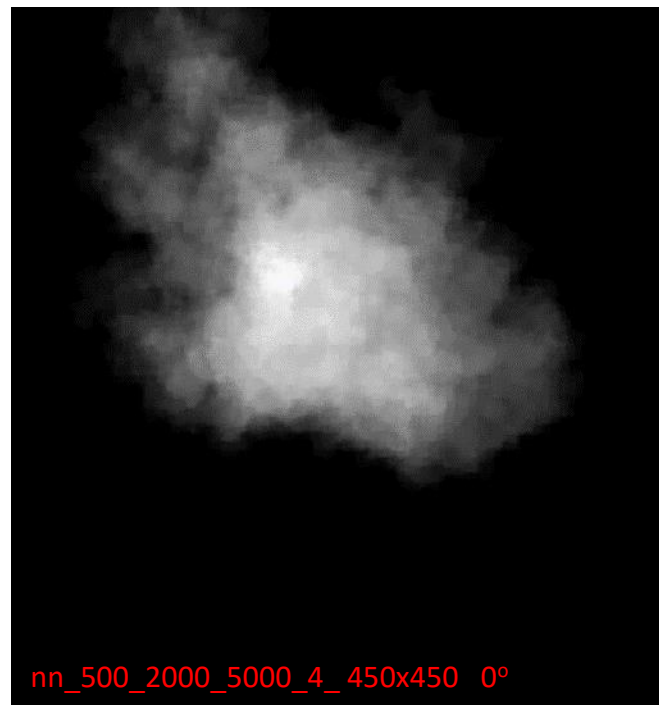
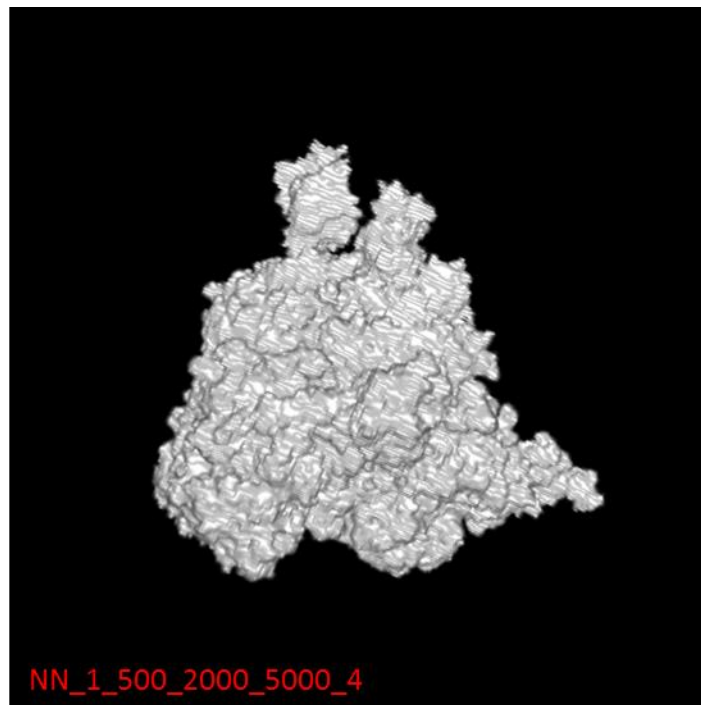
NN_1_500_2000_4000_4

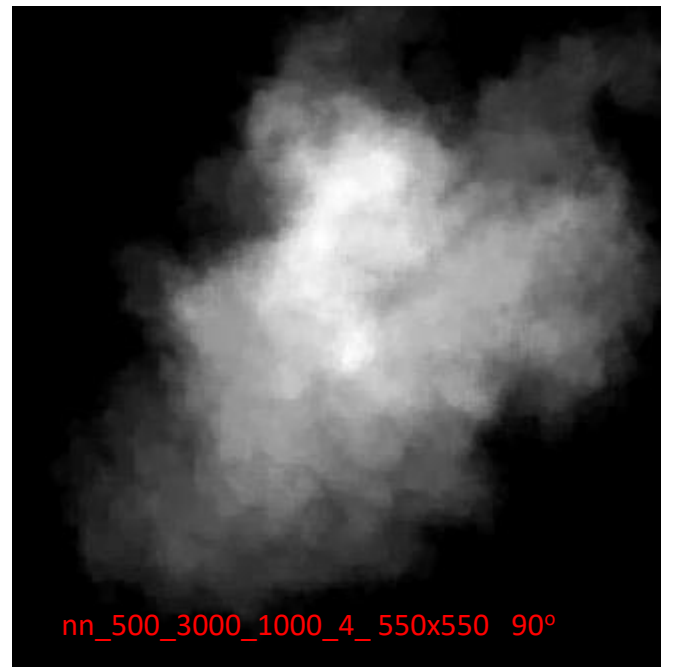
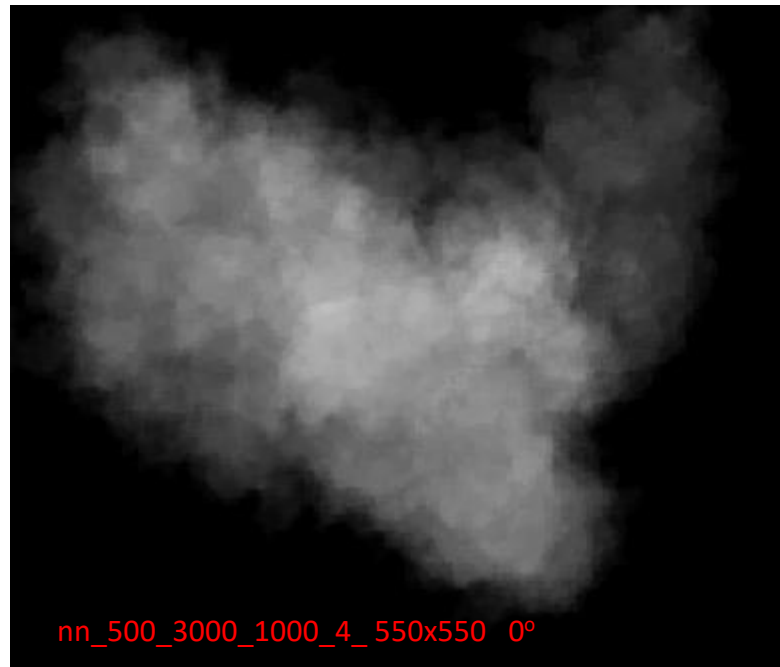
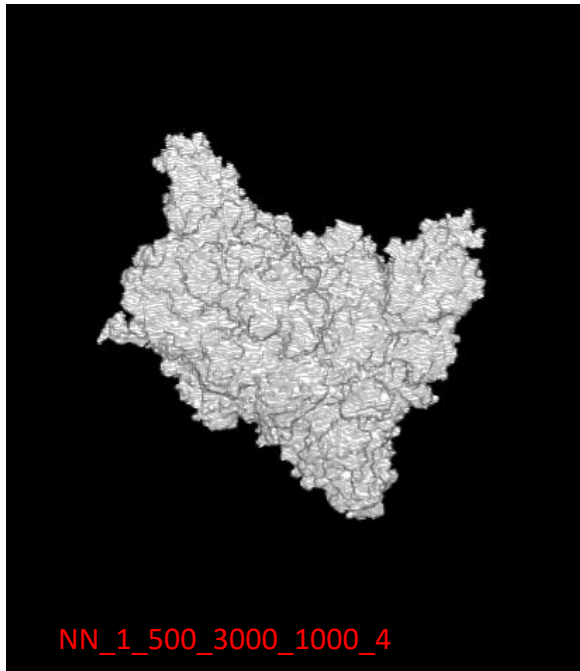
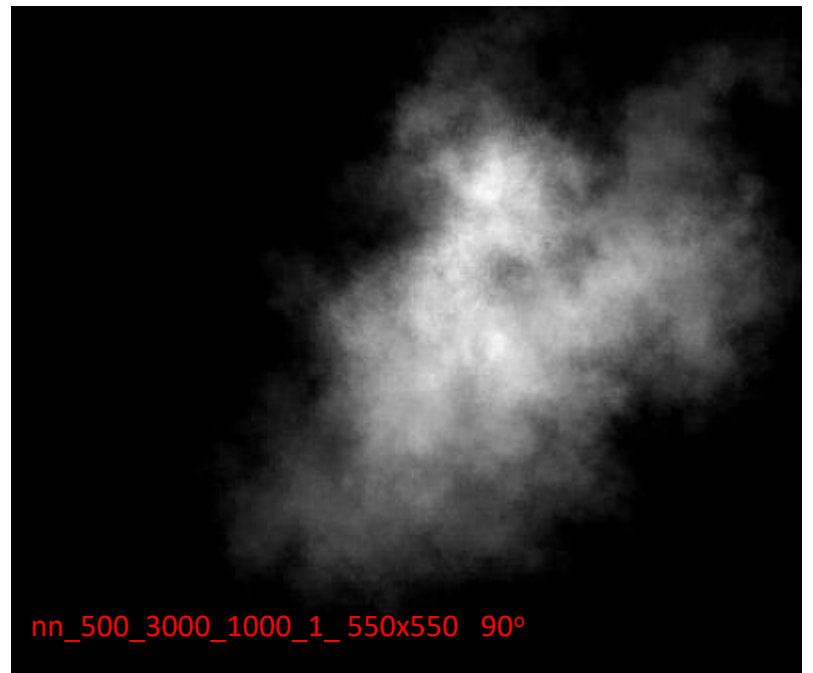
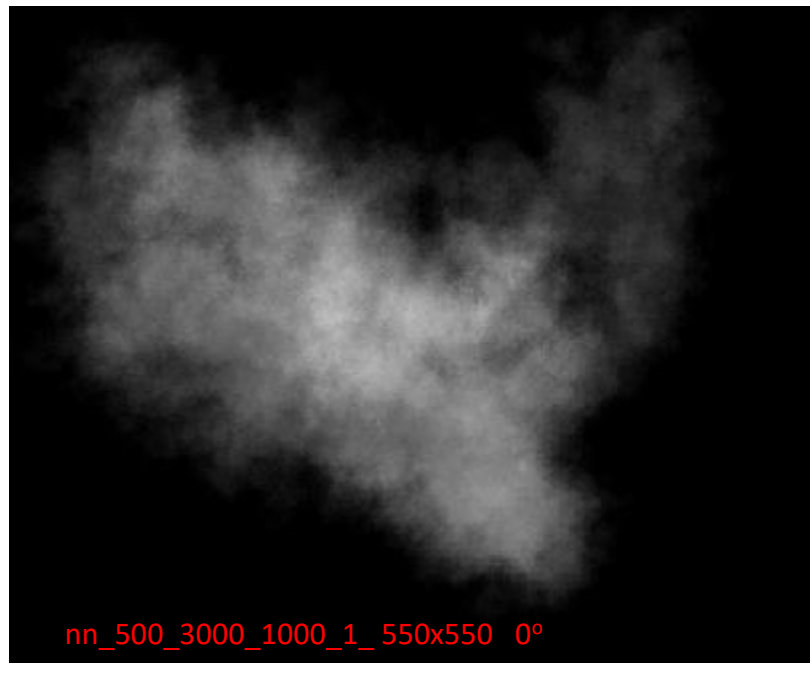
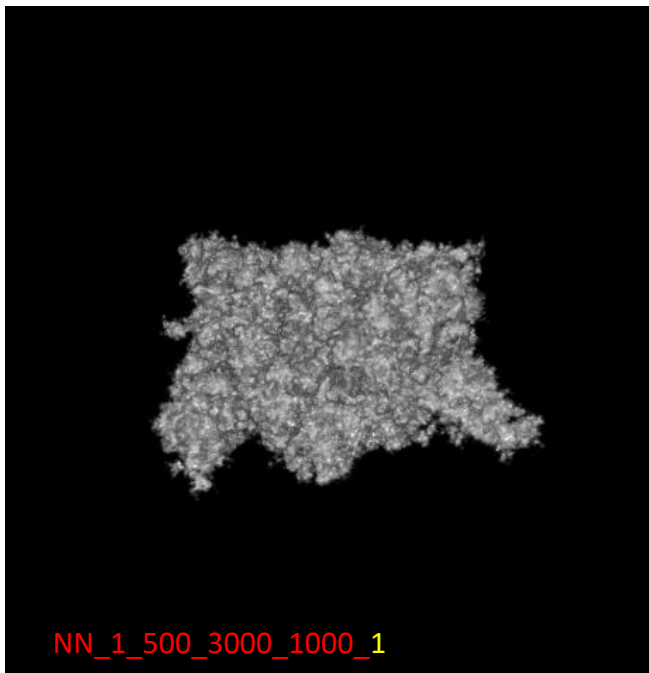


nn_500_2000_4000_4_450x450 0°



nn_500_2000_4000_4_450x450 90°

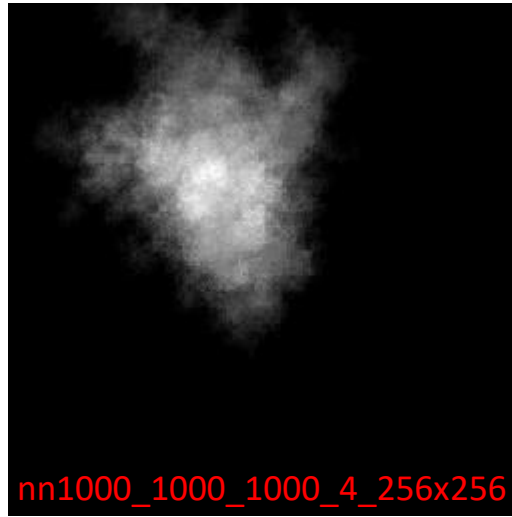




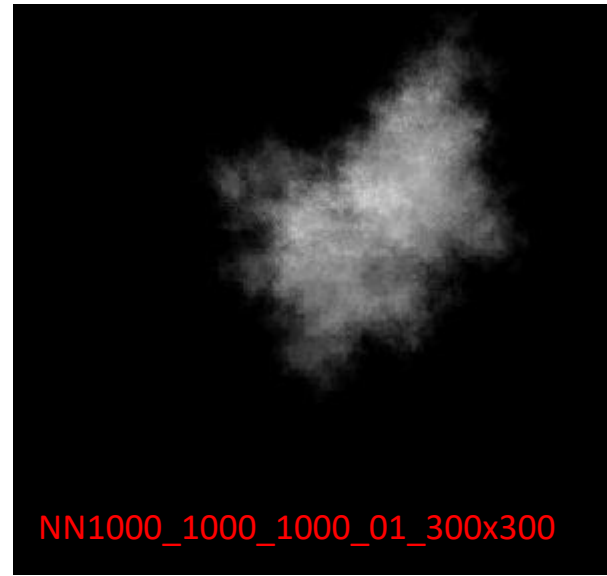
Ray step 0.05 mm



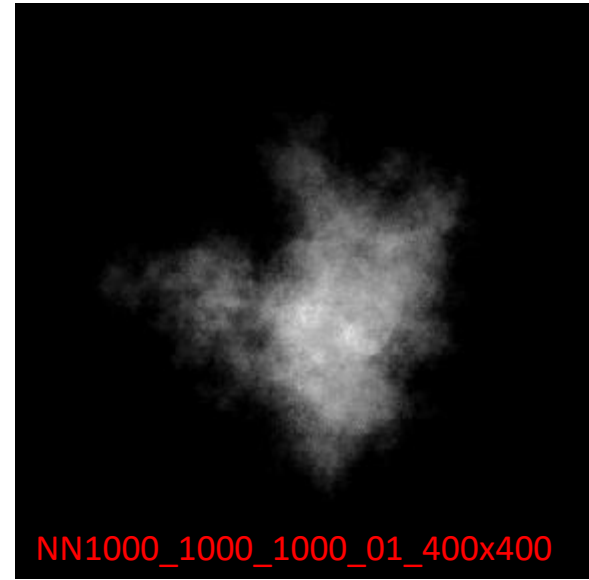
NN_1000_1000_1000



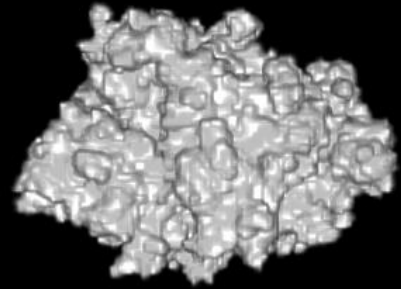
nn1000_1000_1000_4_256x256



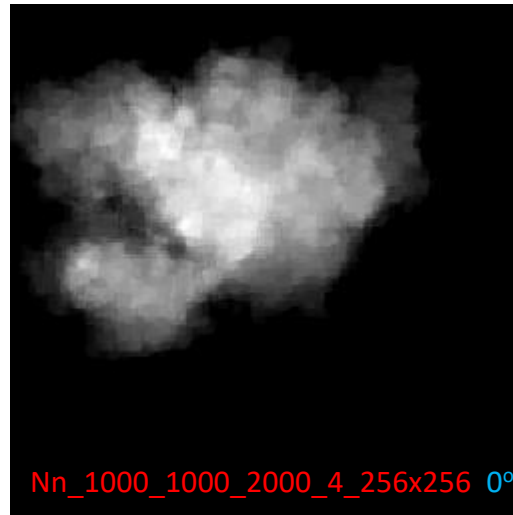
NN1000_1000_1000_01_300x300



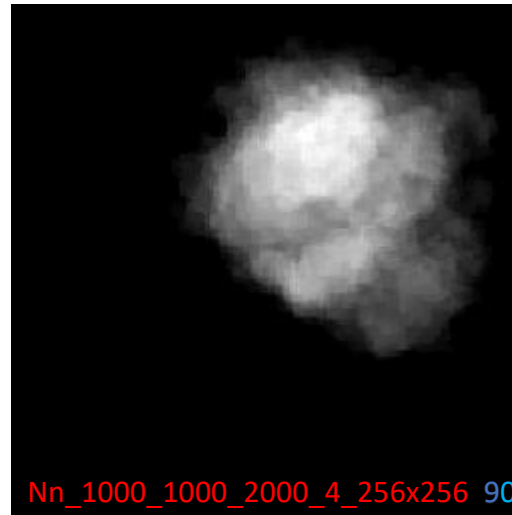
NN1000_1000_1000_01_400x400



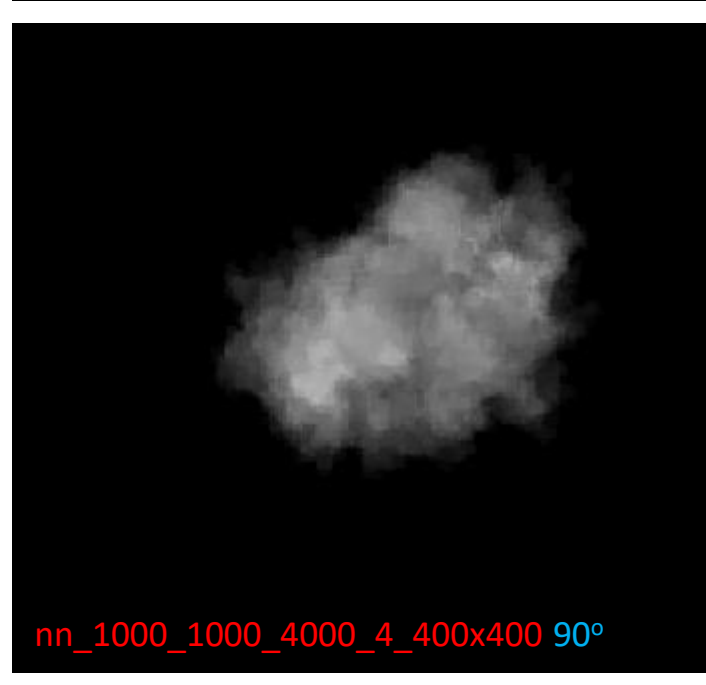
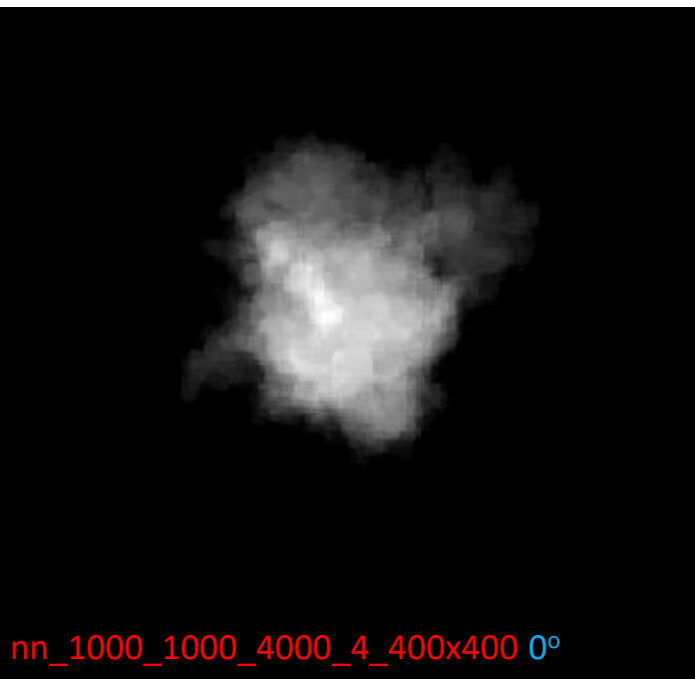
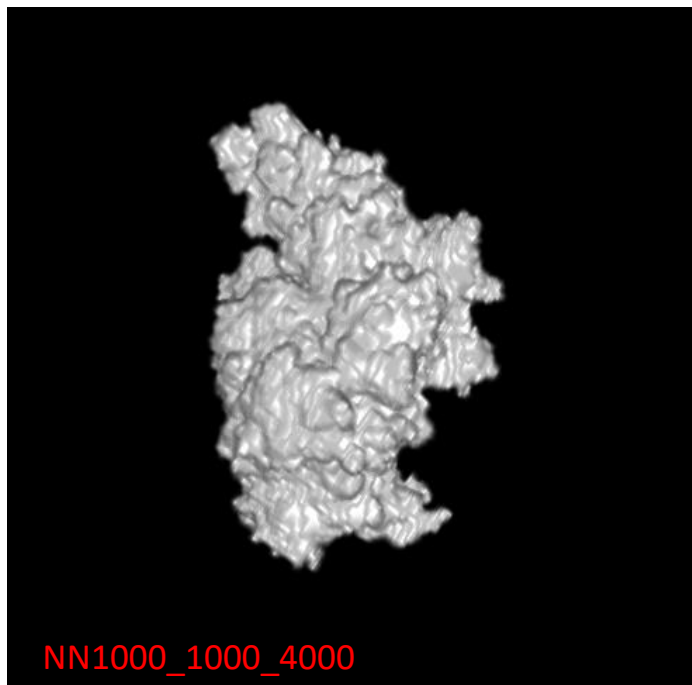
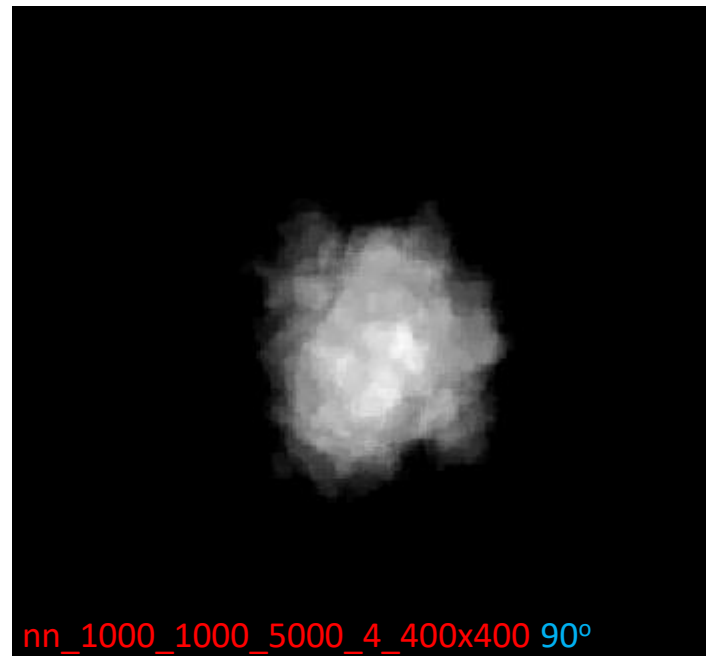
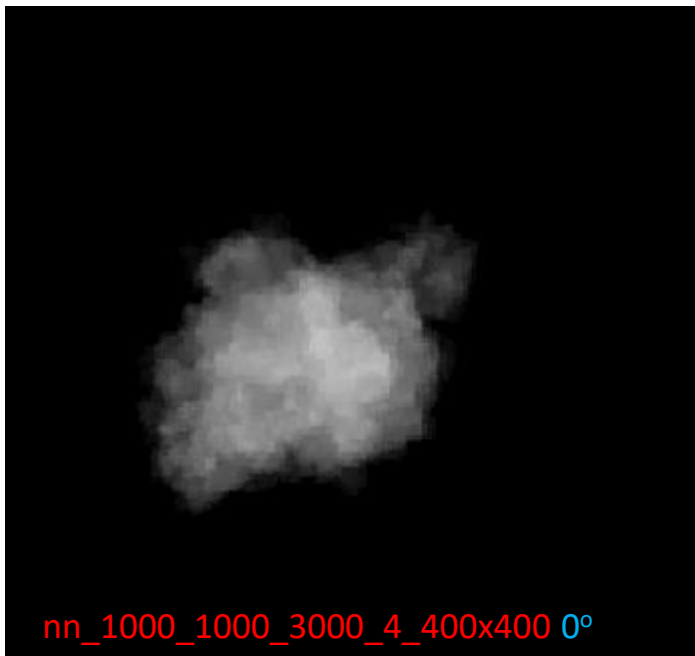
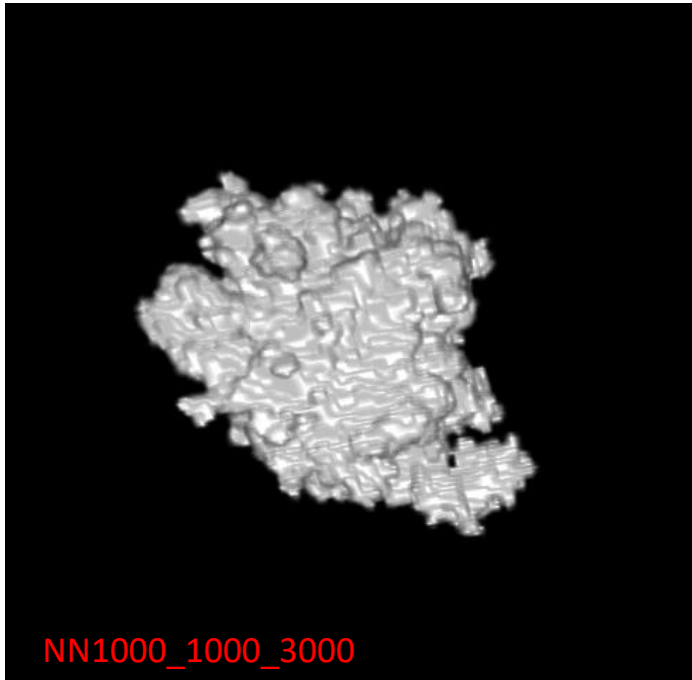
NN1000_1000_2000



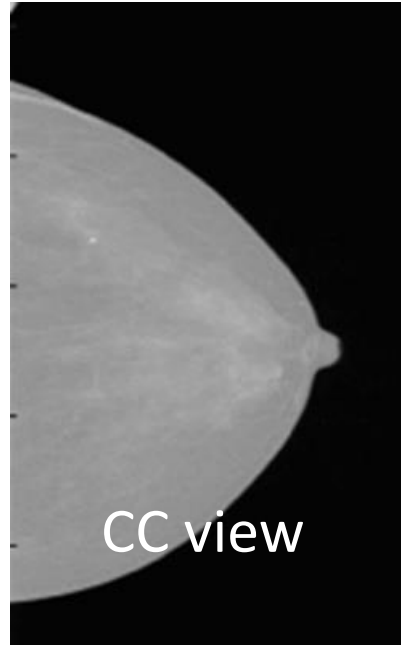
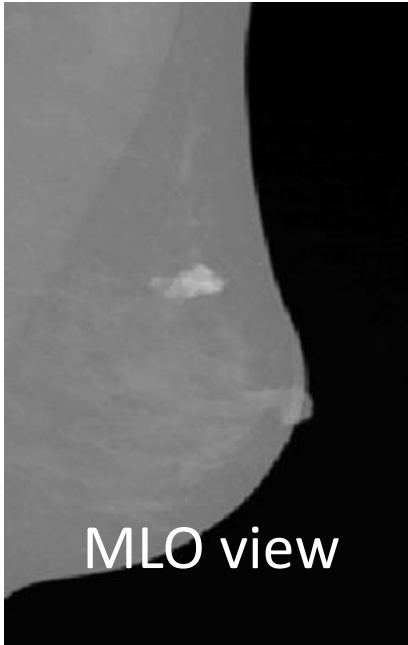
Nn_1000_1000_2000_4_256x256 0°



Nn_1000_1000_2000_4_256x256 90°



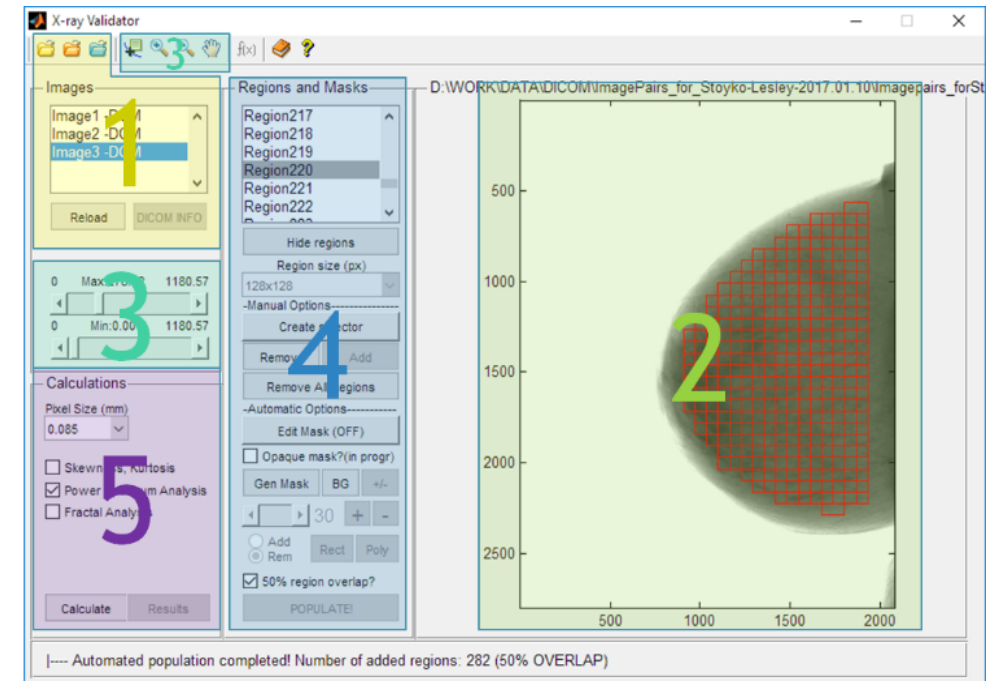
Under development



Gospodinova, 2018, ACT2018, Ohrid

The created Images are stored in a database and will be used in the further assessment, research and educational activities.


Objective evaluation



Subjective evaluation

4 AFC

Database organisation



MAXIMA Project Database

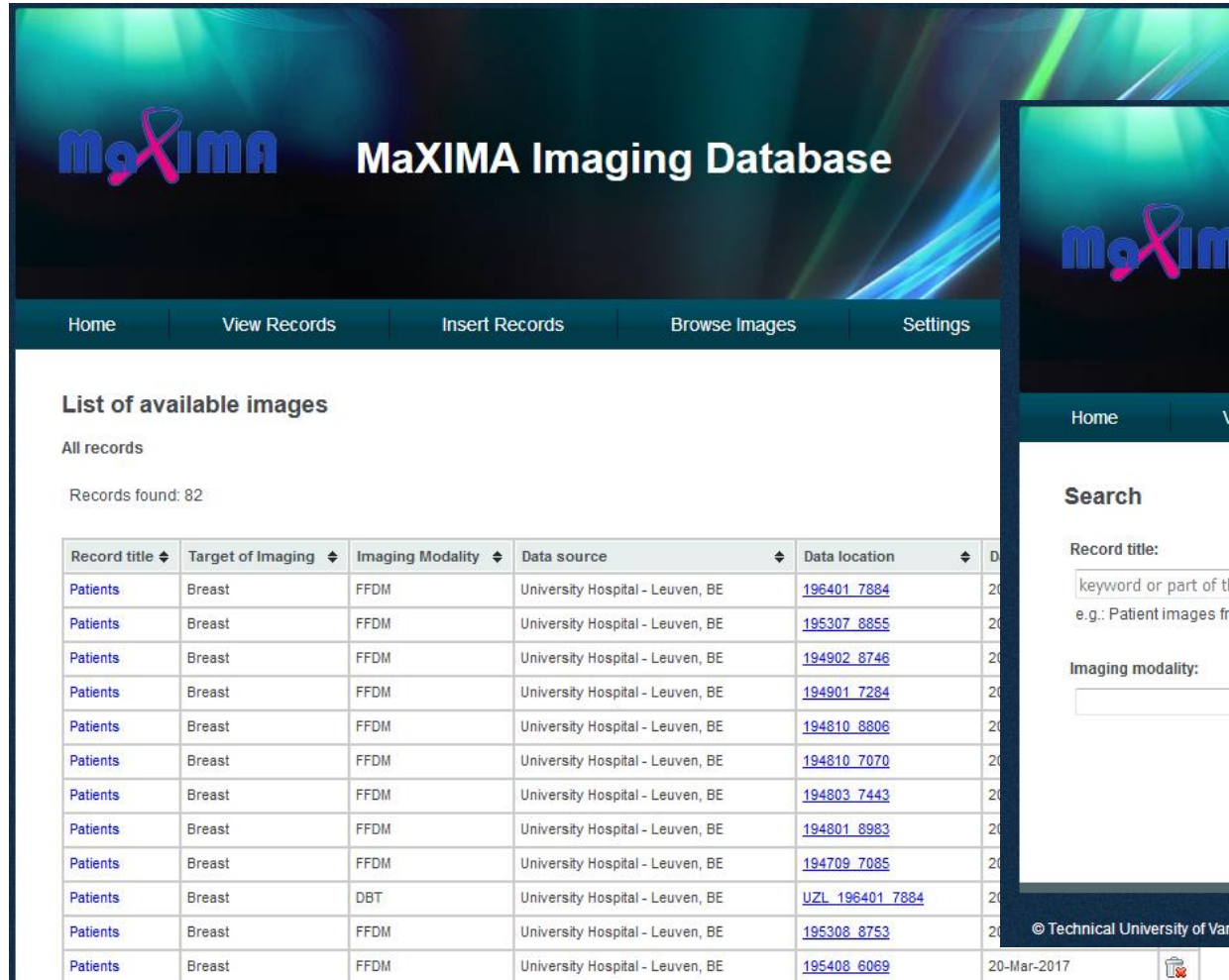
[Home](#) | [Search](#) | [Insert records](#) | [Settings](#) | [Logout](#)

MAXIMA Project Database

The common shared database, contains 3D images of breast cancers with irregular shapes, which will be used further to boost the research activities at project universities as well as in the educational field.

© Technical University of Varna 2017 [About us](#) [Links](#)

Database web-based interface



maXIMA MaXIMA Imaging Database

Home View Records Insert Records Browse Images Settings

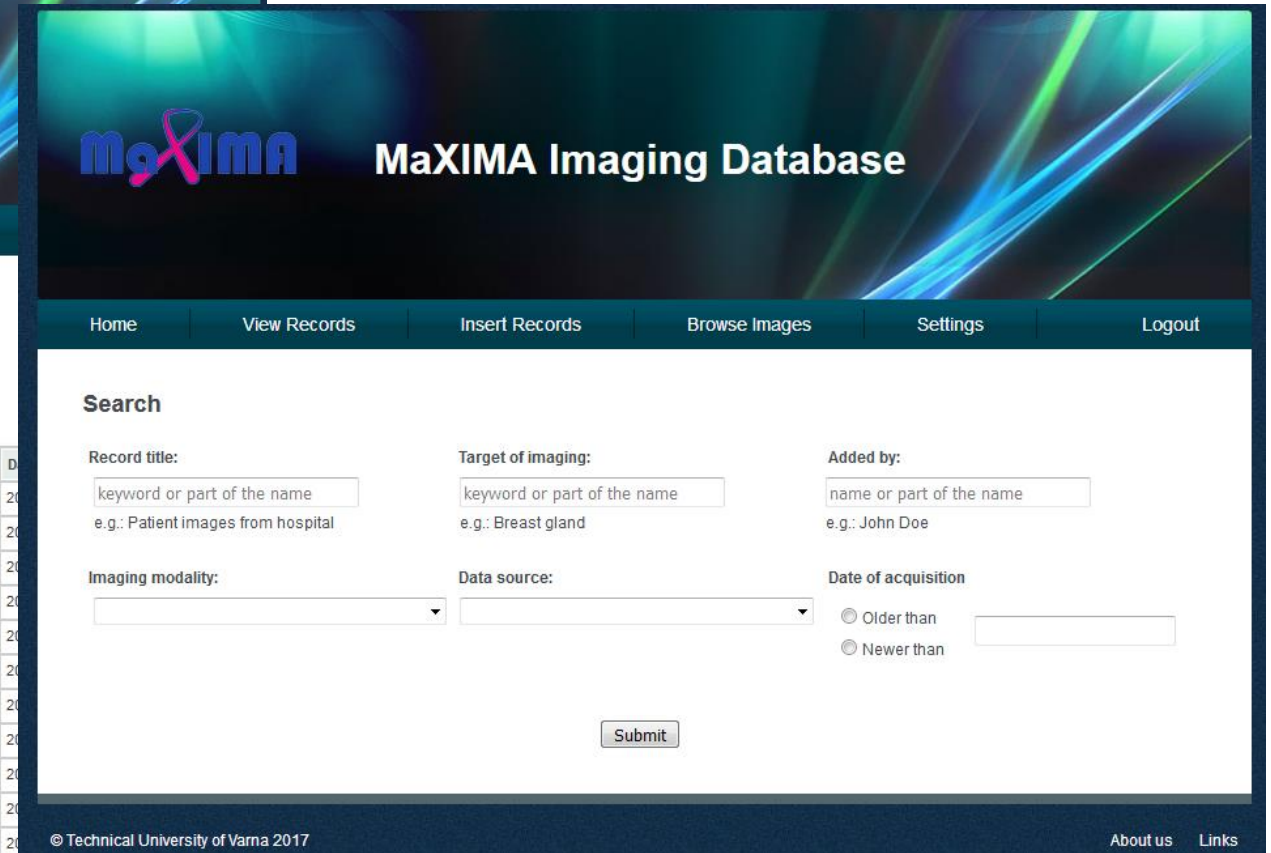
List of available images

All records

Records found: 82

Record title	Target of Imaging	Imaging Modality	Data source	Data location	D
Patients	Breast	FFDM	University Hospital - Leuven, BE	196401_7884	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	195307_8855	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	194902_8746	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	194901_7284	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	194810_8806	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	194810_7070	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	194803_7443	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	194801_8983	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	194709_7085	20
Patients	Breast	DBT	University Hospital - Leuven, BE	UZL_196401_7884	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	195308_8753	20
Patients	Breast	FFDM	University Hospital - Leuven, BE	195408_6069	20

20-Mar-2017



maXIMA MaXIMA Imaging Database

Home View Records Insert Records Browse Images Settings Logout

Search

Record title:
e.g.: Patient images from hospital

Target of imaging:
e.g.: Breast gland

Added by:
e.g.: John Doe

Imaging modality:


Data source:

Date of acquisition: Older than
 Newer than

© Technical University of Varna 2017

About us Links

Database organisation



MAXIMA Project Database

Home Search Insert records Settings Logout

Search

Record title:

Target of imaging:

Added by:

Imaging modality:

Data source:

Date of acquisition
 Older than
 Newer than

Submit

© Technical University of Varna 2017 [About us](#) [Links](#)

Database organisations



MAXIMA Project Database

[Home](#)[Search](#)[Insert records](#)[Settings](#)[Logout](#)


List of available images

Records found: 1

Record title	Target of Imaging	Imaging Modality	Data source	Data location	Date of acquisition	
pat1	dog	CT	St. Anna	baubau	11/25/2014	

[New search](#)

Database organisation



MAXIMA Project Database

Home Search Insert records Settings Logout

DB Records

Edit record

Record title:

Target of imaging:


Imaging modality:

Data source:

Image location (Click to change):

Date of acquisition:

Additional details:



MAXIMA Project Database

Home Search Insert records Settings Logout

DB Records

Insert record

Record title:

Target of imaging:

Imaging modality:

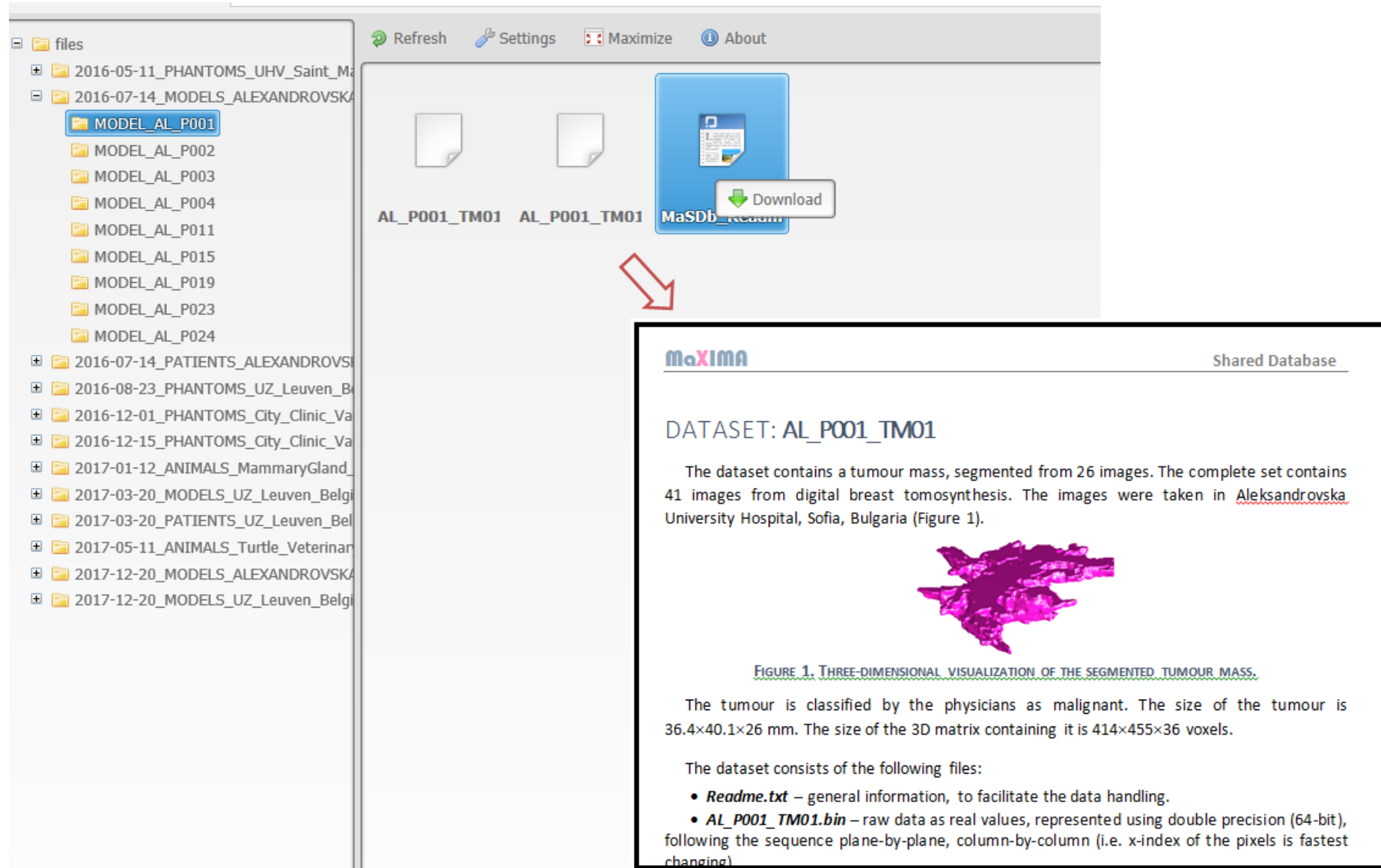
Data source:

Image location (Click to change):

Date of acquisition:

Additional details:

Irregular masses - description



The image displays a file explorer interface on the left, showing a directory structure under 'files'. The folder 'MODEL_AL_P001' is selected, and a red arrow points from it to a 'Download' button for a file named 'MaSDB_readme'. Below this, a 'MaxIMA Shared Database' page is shown for 'DATASET: AL_P001_TM01'. The page contains a 3D visualization of a segmented tumour mass, which is a complex, irregular shape rendered in a reddish-pink color. The page also includes a caption and descriptive text about the dataset.

MaxIMA Shared Database

DATASET: AL_P001_TM01

The dataset contains a tumour mass, segmented from 26 images. The complete set contains 41 images from digital breast tomosynthesis. The images were taken in [Aleksandrovska University Hospital, Sofia, Bulgaria](#) (Figure 1).

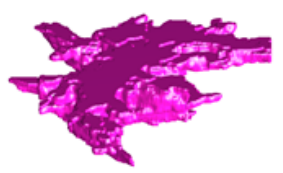


FIGURE 1. THREE-DIMENSIONAL VISUALIZATION OF THE SEGMENTED TUMOUR MASS.

The tumour is classified by the physicians as malignant. The size of the tumour is 36.4×40.1×26 mm. The size of the 3D matrix containing it is 414×455×36 voxels.

The dataset consists of the following files:

- **Readme.txt** – general information, to facilitate the data handling.
- **AL_P001_TM01.bin** – raw data as real values, represented using double precision (64-bit), following the sequence plane-by-plane, column-by-column (i.e. x-index of the pixels is fastest changing).

Outline

- Why realistic models of abnormalities?
- Our approach and advances
- **Exploitation of results in practice**

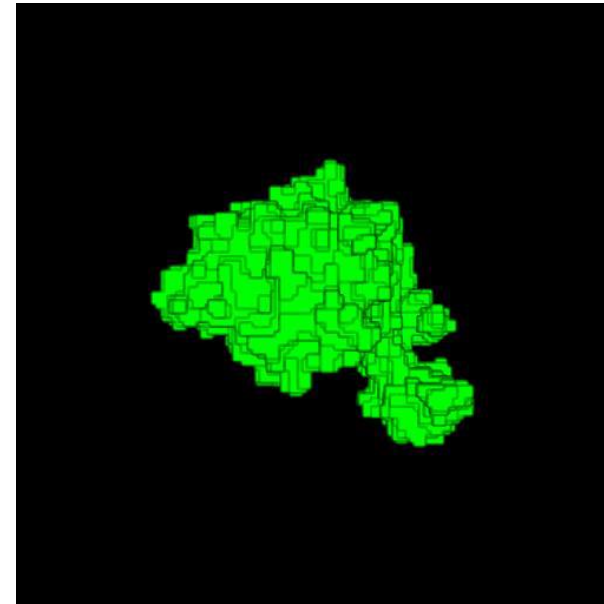
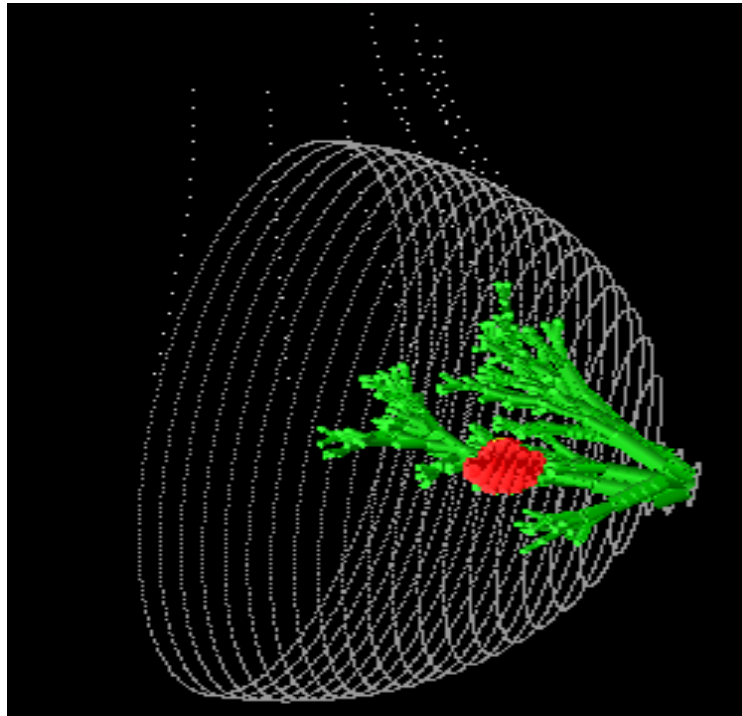
Exploitation of results

- Research
- Education
- Fun

Exploitation of results

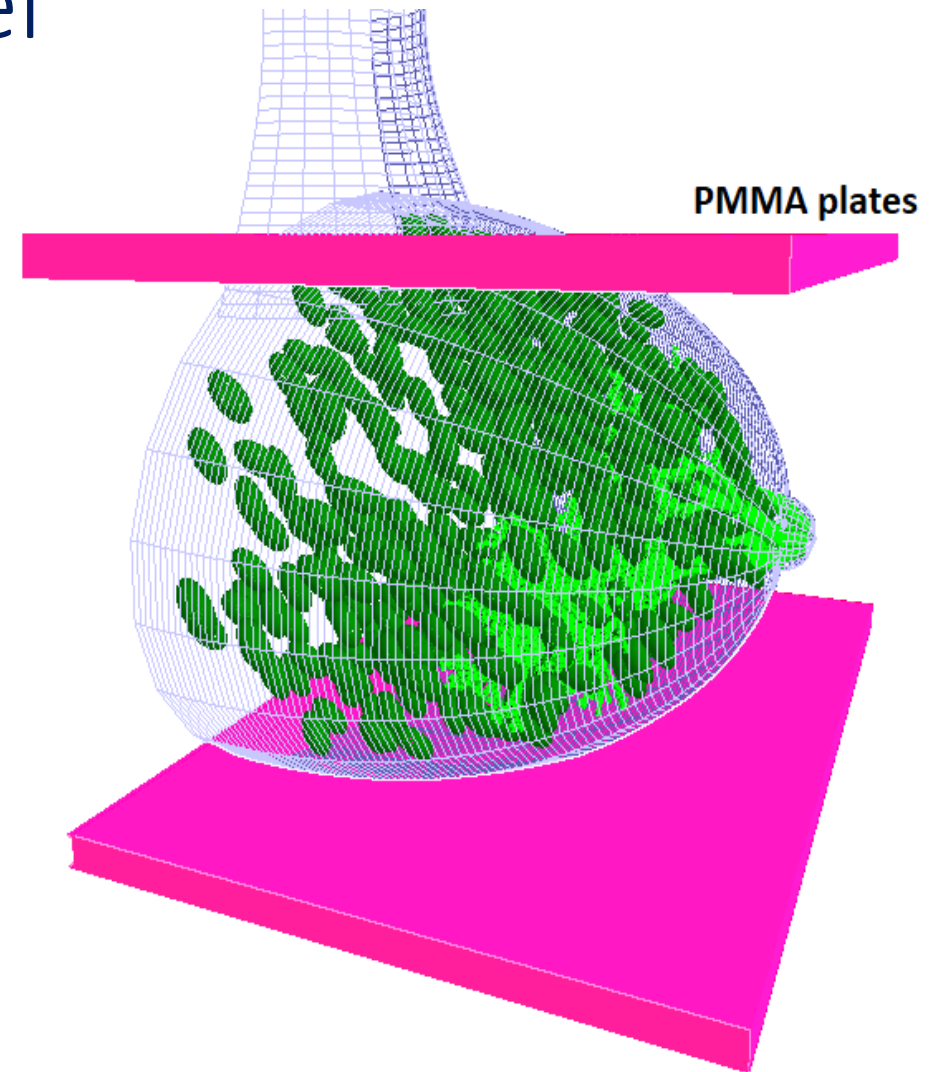
- Research
- Education
- Fun

To study novel breast imaging techniques



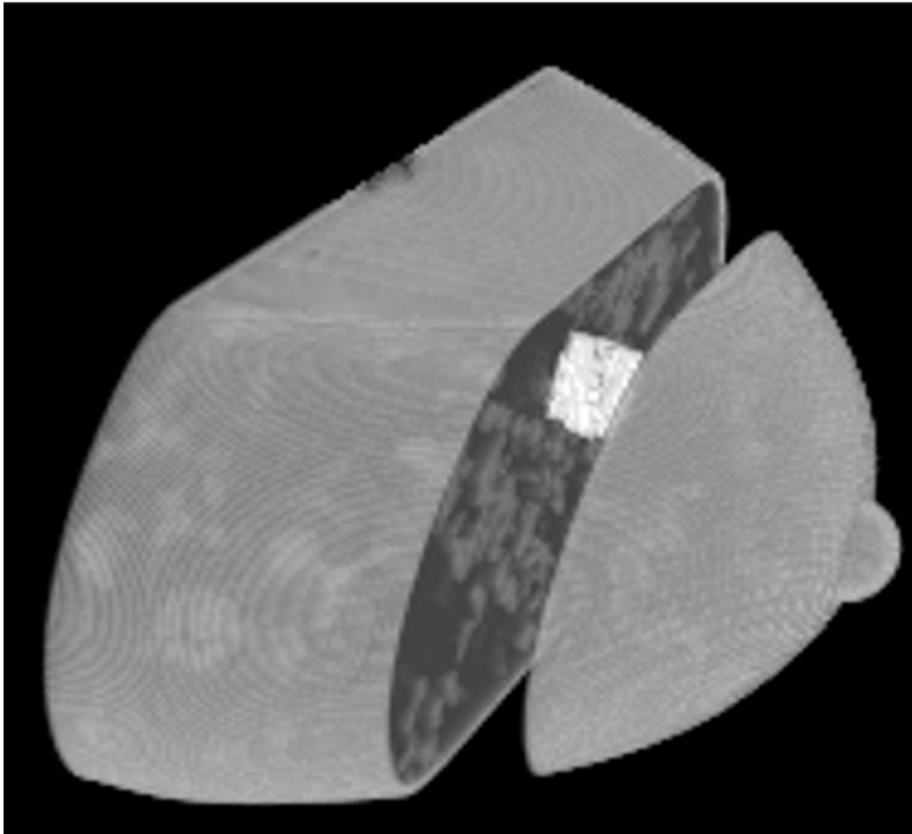
Creation of breast model

- Simulation of the compression procedure

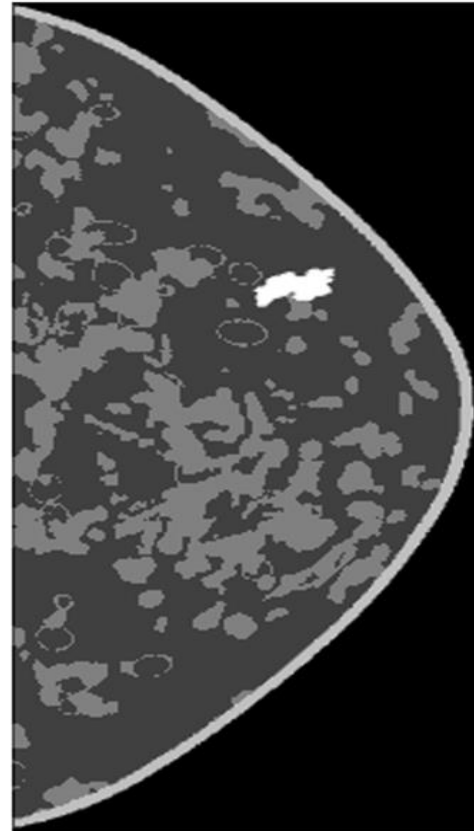


Compressed breast model

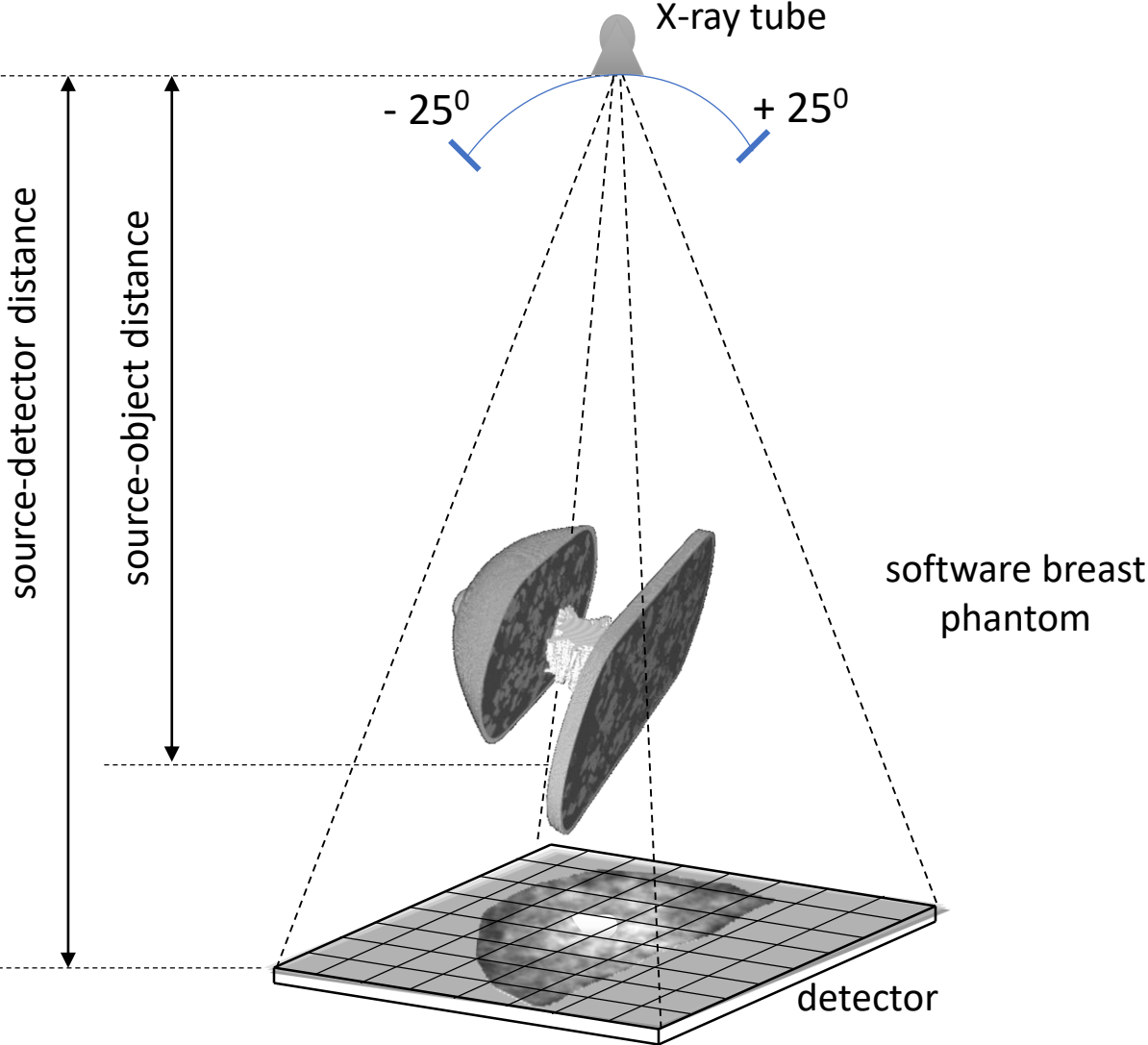
3D view



slice

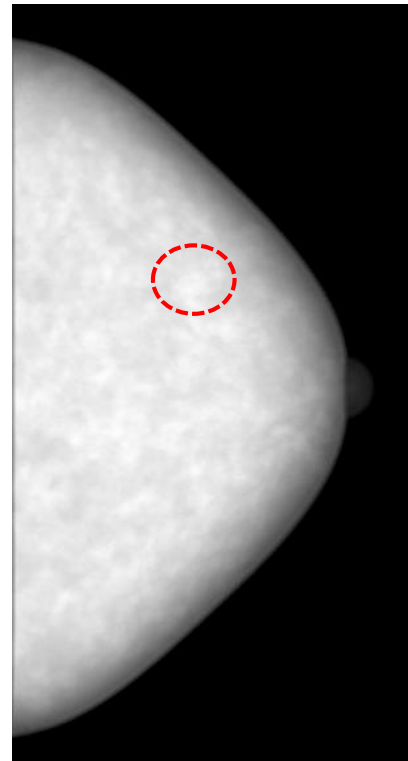


Example

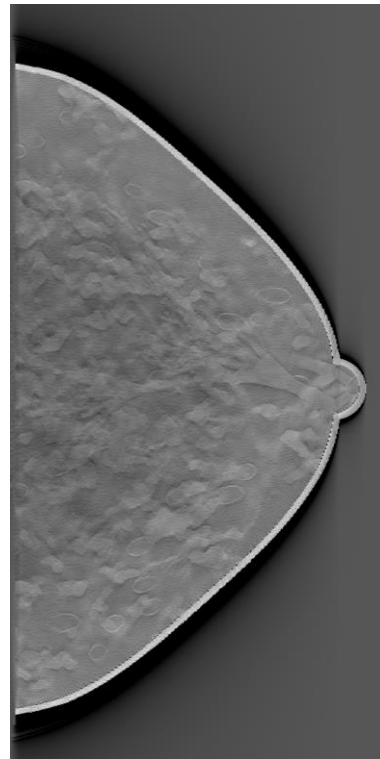


Software
X-ray Imaging
Simulators

Images obtained with the software phantom



(a)



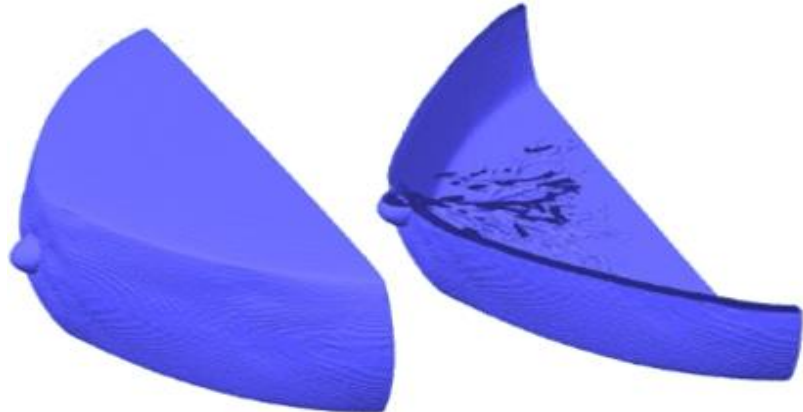
(b)



(c)

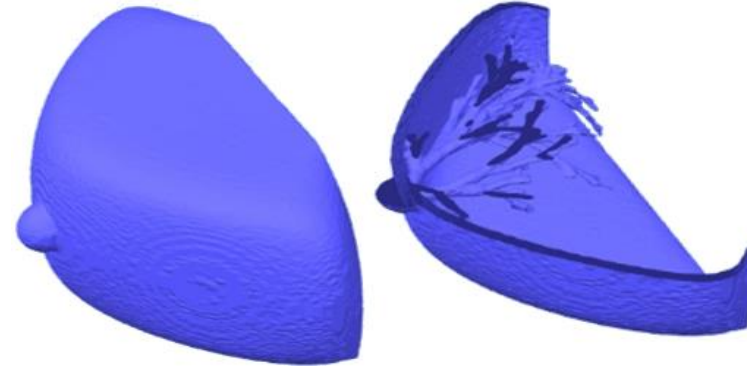
Phantoms for the study

- Breast shape – Clear resin;
- Glandular tree – Clear resin;

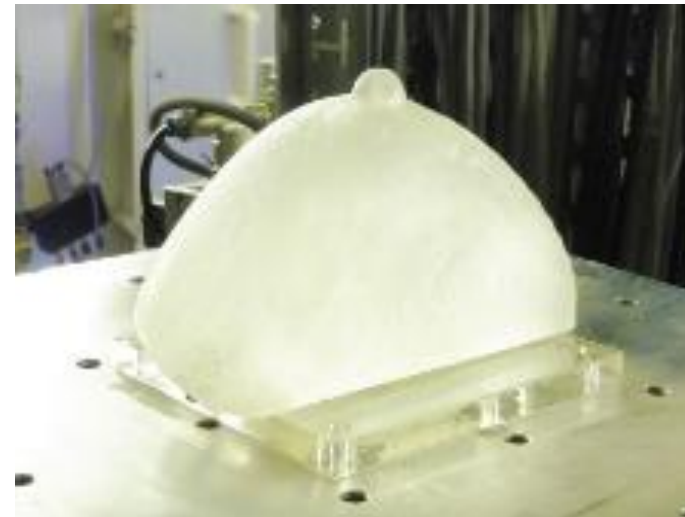
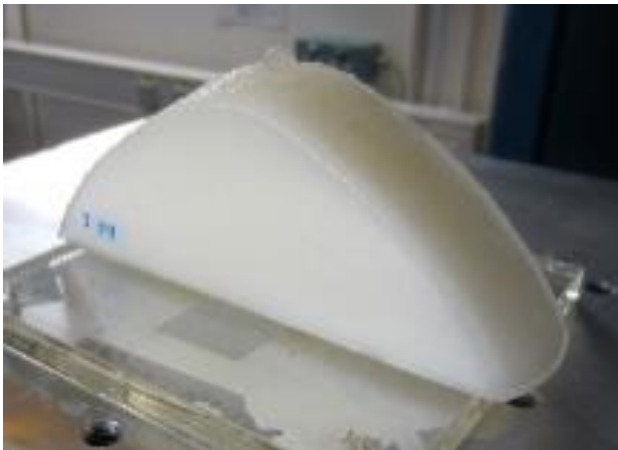


- Animal fat;
- Thickness – 31 mm;
- Wall thickness – 1.7 mm.

- Container – Clear resin;
- Glandular tree – Clear resin;

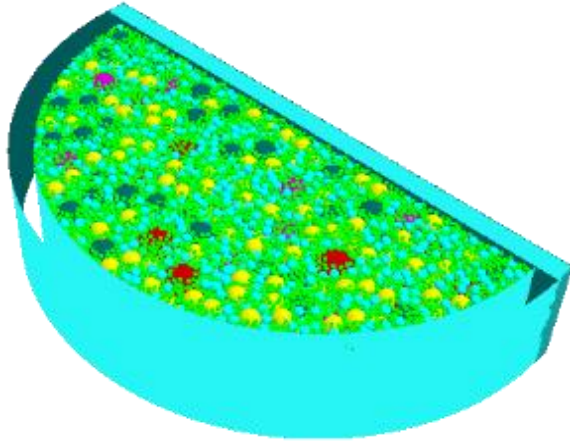


- Water;
- Thickness – 49 mm;
- Wall thickness – 2.4 mm.



Phantoms for the study

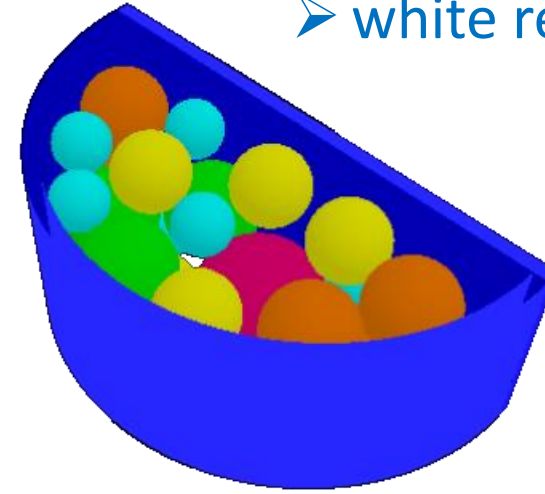
- ~ 33000 PMMA spheres;
- radiuses [0.79 - 7.94] mm;



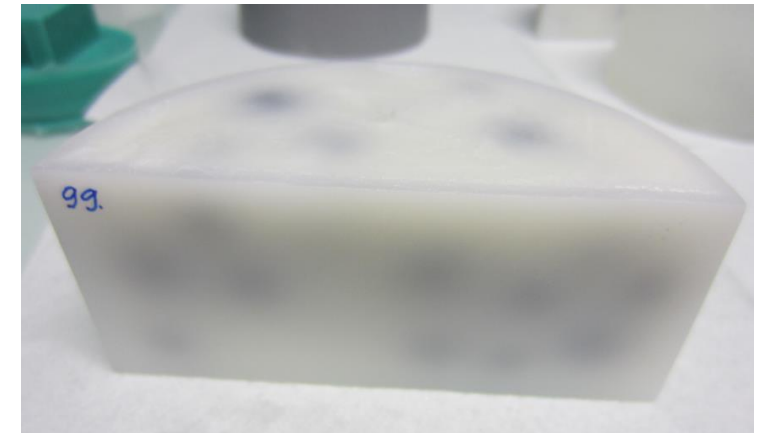
- PMMA container;
- water.



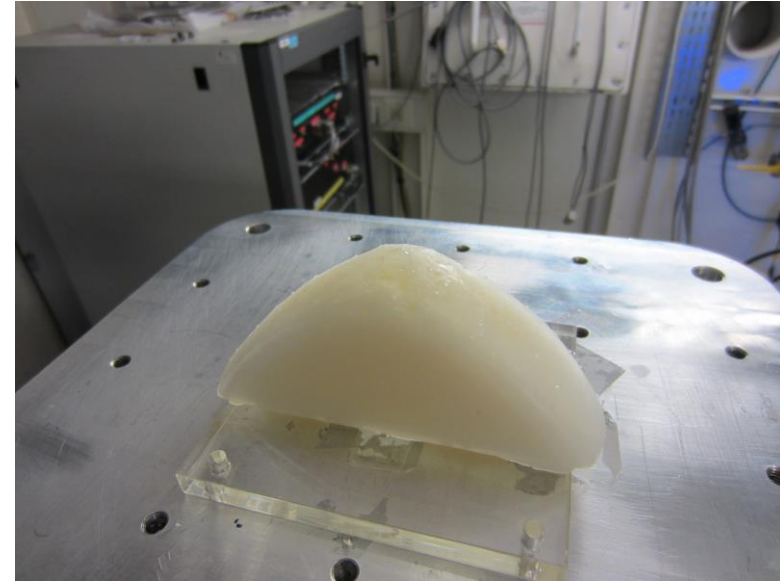
- 27 spheres from Gray resin;
- radiuses [6 - 13] mm;
- white resin container;



- animal fat;
- wall thickness 3 mm.



Setup



- ✓ 60keV
- ✓ Planar images
- ✓ Tomosynthesis - 25 projection images

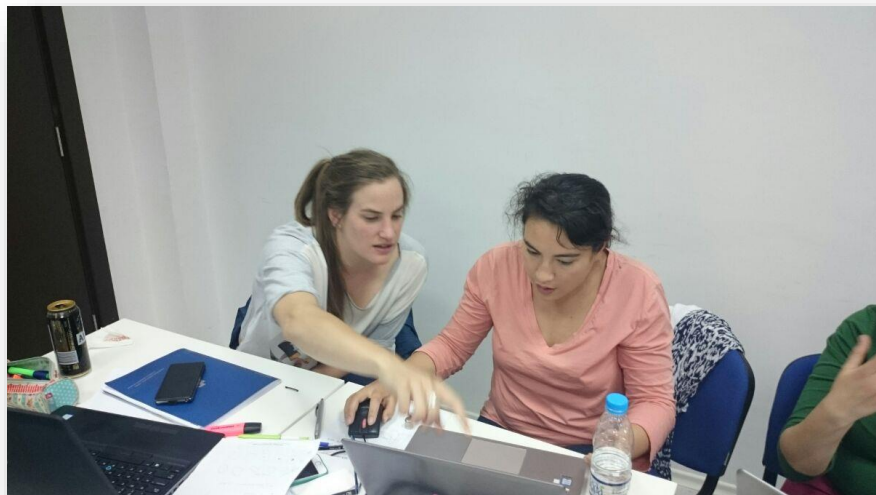
Exploitation of results

- Research
- **Education**
- Fun

★ Eutempe-net training course, Varna 22-26/05/2017



- How to model x-ray imaging chain;
- How to model breast;
- How to model breast cancer;
- How to work in a team;
- How to write abstracts;
- How to present a scientific work.



Virtual study to investigate the detectability of breast abnormalities on 2D mammography and digital breast tomosynthesis

Kristina Tri Wigati^{1,2}, Hannah Manssens³, Liesbeth Vancoillie², Lesley Cockmartin⁴, Djarwani S. Soejoko¹, Hilde Bosmans^{2,4}, and Kristina Bliznakova⁵

¹ *Department of Physics, Faculty of Mathematics and Natural Sciences, University of Indonesia*

² *Department of Imaging and Pathology, Faculty of Medicine, KU Leuven*

³ *Barco nv, Belgium*

⁴ *Department of Radiology, University Hospitals Leuven*

⁵ *Laboratory of Computer Simulations in Medicine, Technical University of Varna*

E-mail: kristina.tw@ui.ac.id

Received August 11 2017

Revised December 06 2017

Accepted for publication February 12 2018

Published March 05 2018

Abstract: This paper describes the use of virtual clinical trial software, as developed and improved in the frame of the Horizon2020 MaXIMA project, to study particular aspects of 2D mammography and digital breast tomosynthesis. A voxel-based breast phantom with inserted mathematical models of an irregular mass and two microcalcifications was created. Image acquisition was simulated by using

Phantom

Dimension of the phantom:

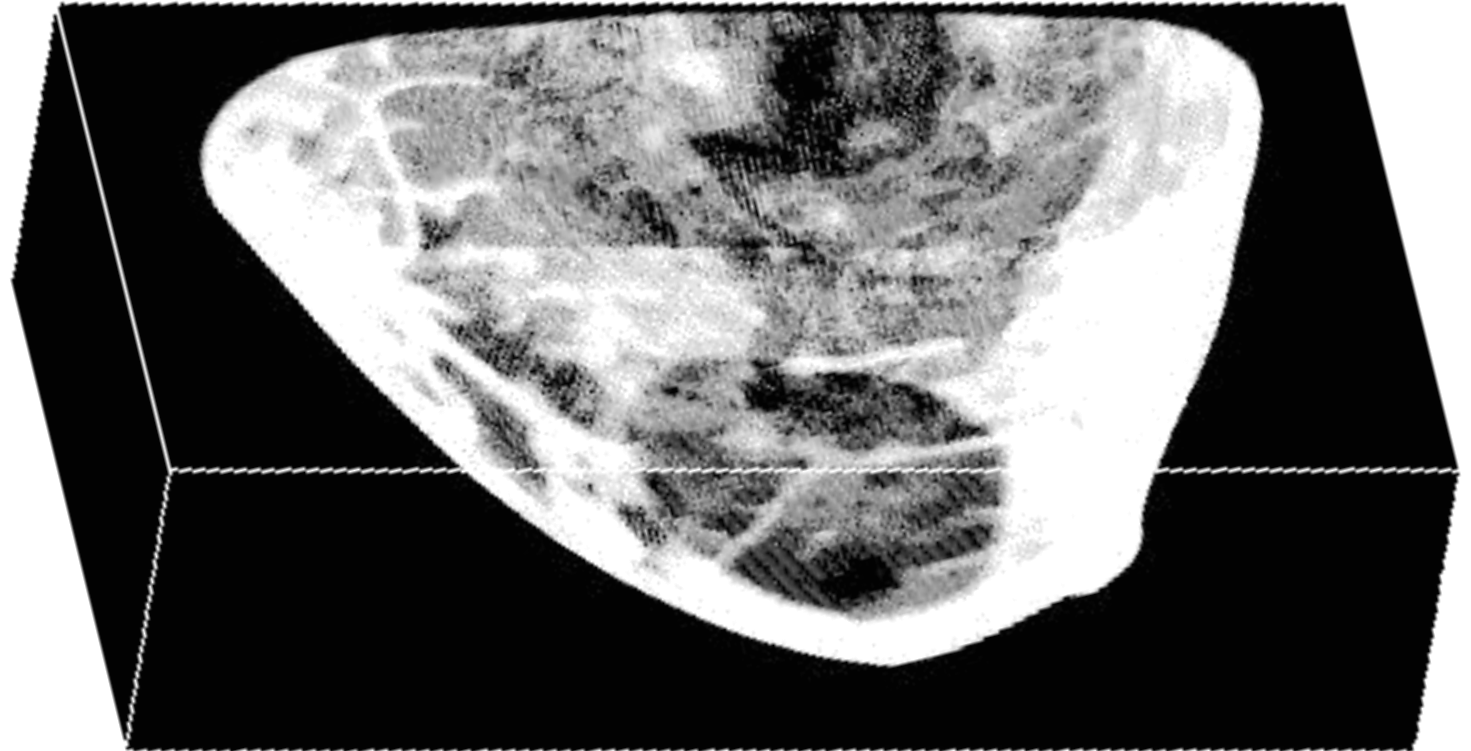
Width : 641 pixels

Length : 357 pixels

Height : 175 pixels

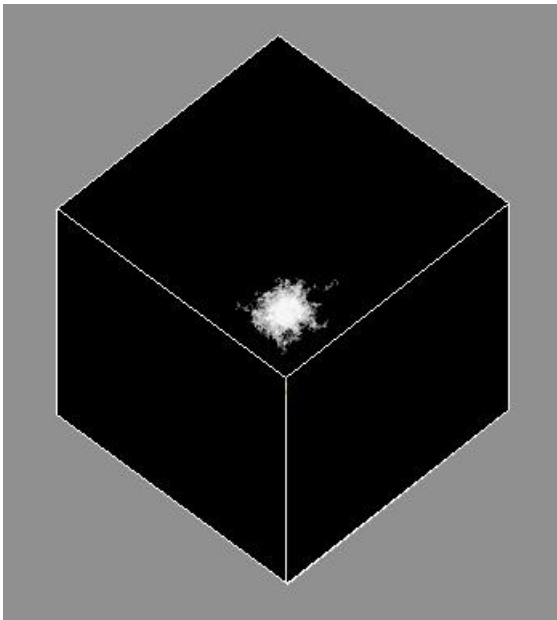
Voxel size:

0.27 mm [each side]

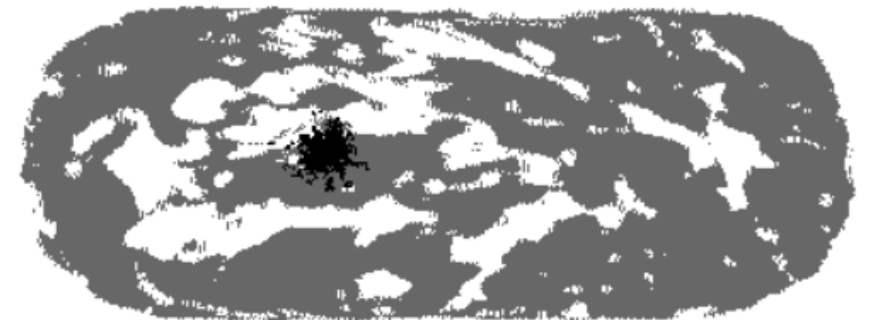


Breast abnormalities

Irregular mass



- The voxelized of irregular mass matrix was placed about the center of the normal breast phantom;
- Resolution: 0.27 mm/pixel



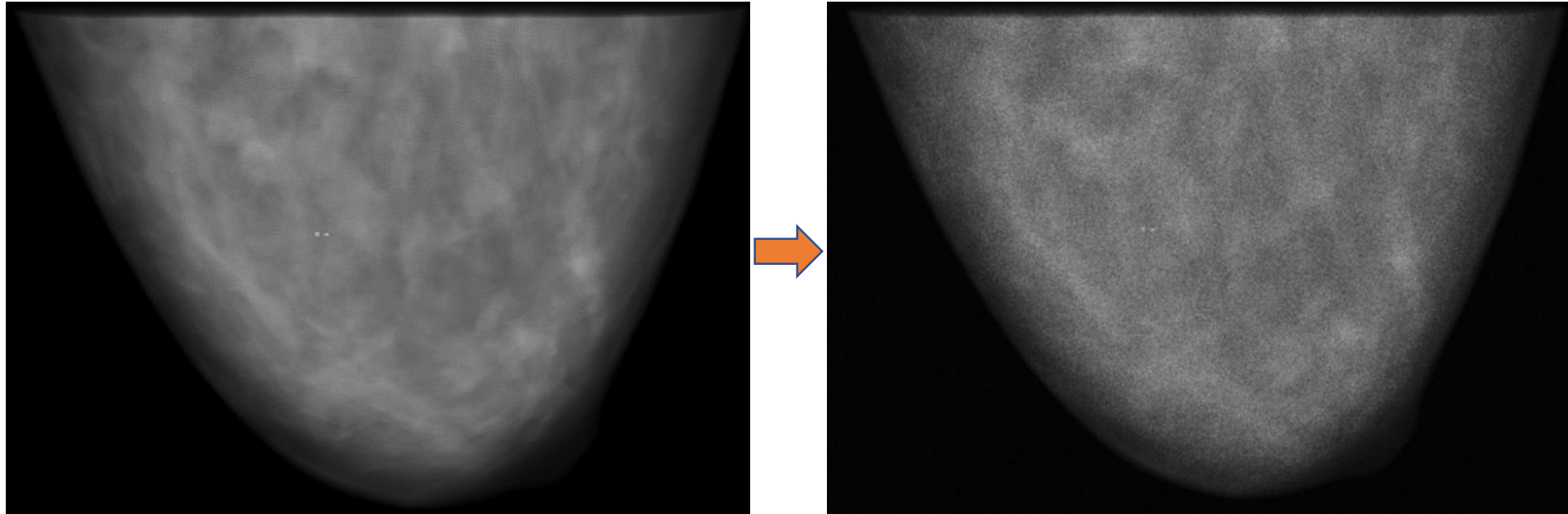
Virtual clinical study

Table 4. Mean pixel value, signal difference, SDNR and contrast of the irregular mass in the 2D mammography and DBT reconstructed slice at $Z = 0$.

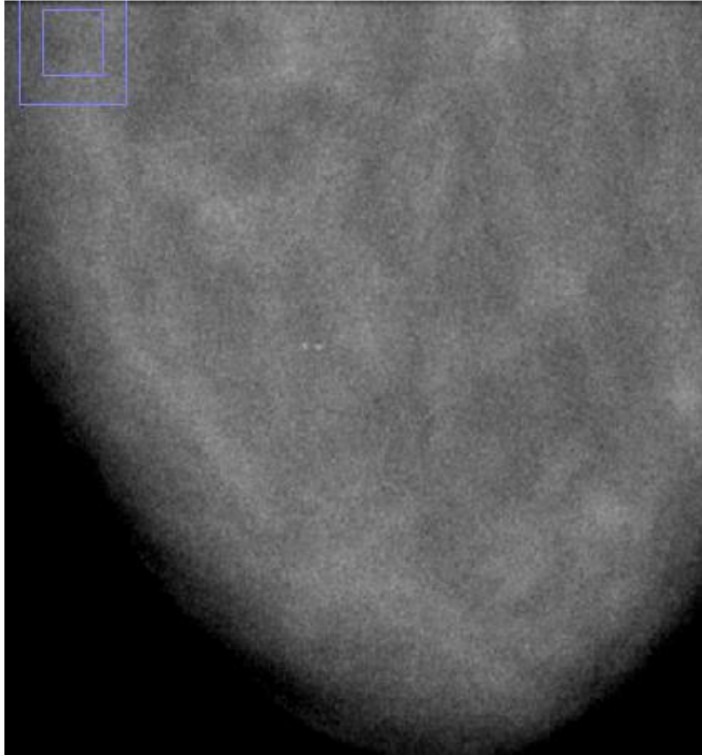
<i>System</i>	<i>Mean pixel value</i>	<i>SD</i>	<i>SDNR</i>	<i>Contrast (%)</i>
2D Mammography	2.25	0.05	1.66	2.47
DBT $\pm 9^\circ$, 10 proj	84.84	10.42	0.21	14.00
DBT $\pm 13^\circ$, 14 proj	83.49	9.65	0.21	13.07
DBT $\pm 15^\circ$, 16 proj	84.64	10.88	0.25	14.75
DBT $\pm 21^\circ$, 22 proj	86.24	10.95	0.25	14.54
DBT $\pm 25^\circ$, 26 proj	87.49	12.80	0.30	17.14

Table 5. Measurements of FWHM calculated using Gaussian interpolation and contrast profiles of the irregular mass.

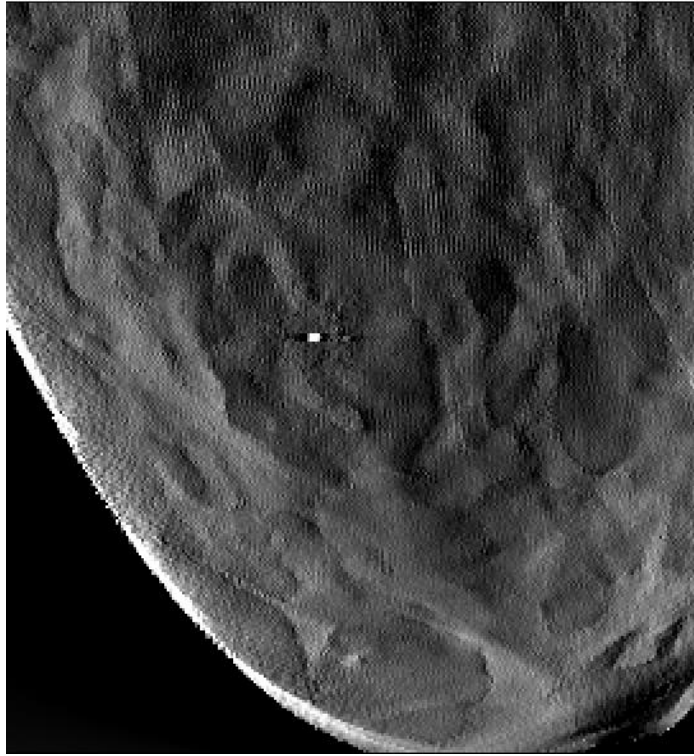
Addition of noise



Qualitative comparison



Mammography



Tomosynthesis with 26
projection images

Exploitation of results

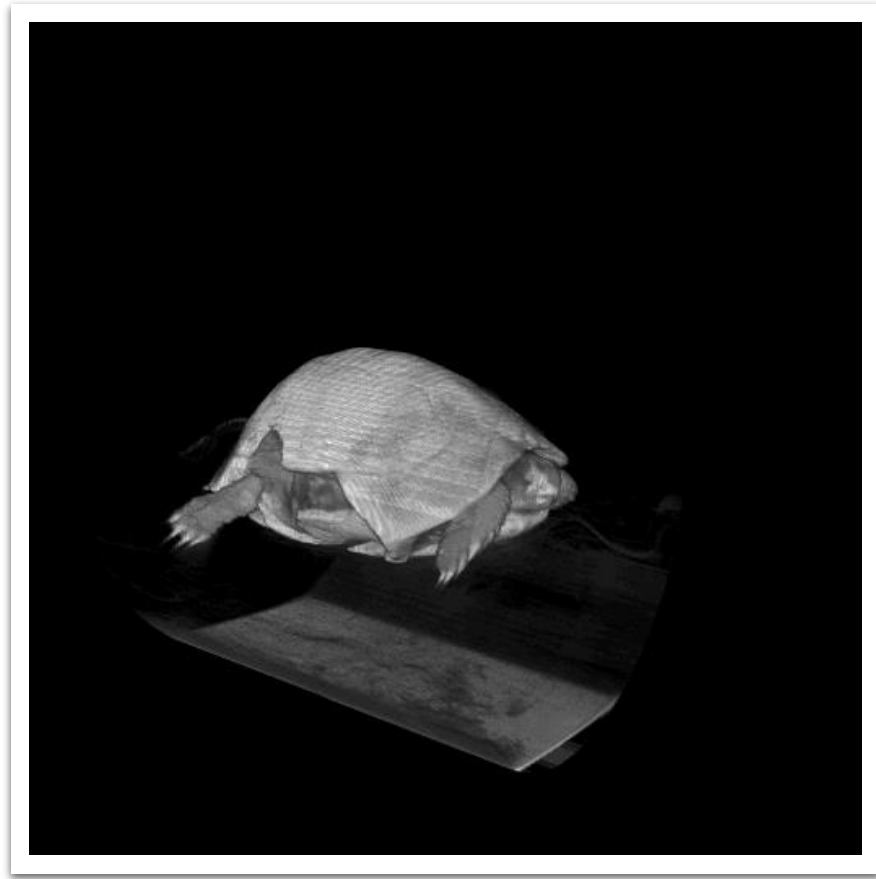
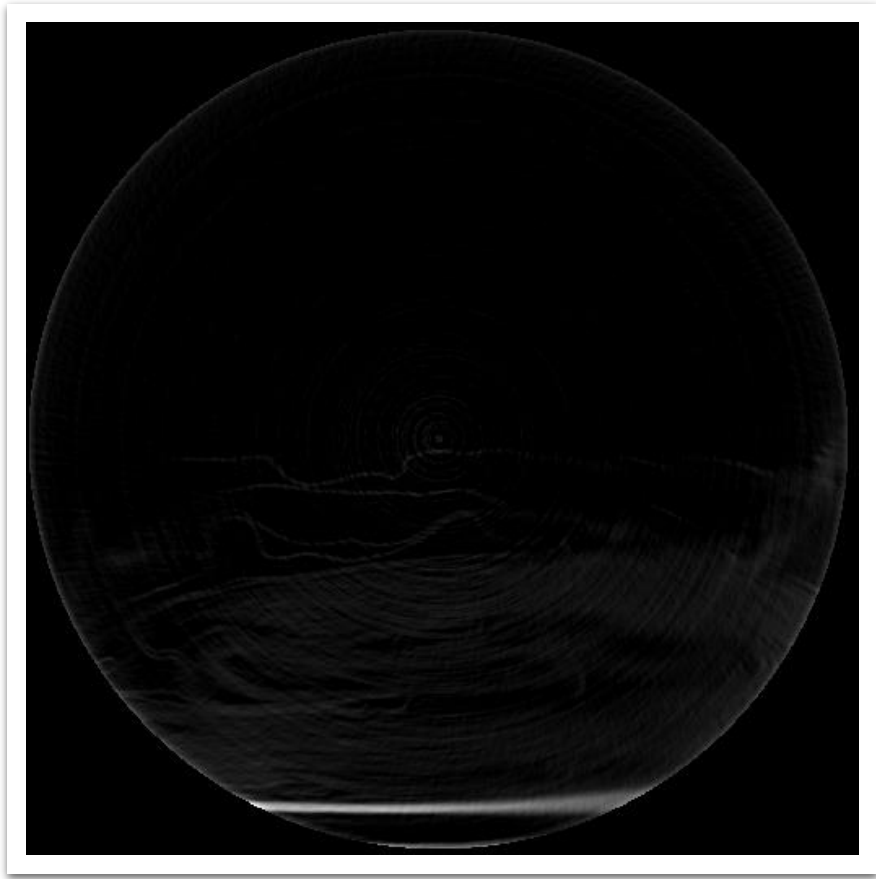
- Research
- Education
- **Fun**

Exploitation

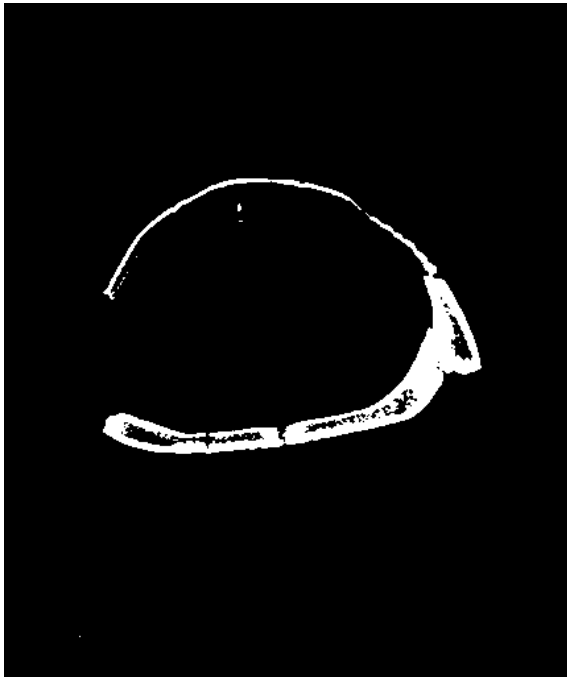


Dukov et al, FOCHOS 2017

CT Scanning



Segmenting a health part



binarization



segmenting the health
part

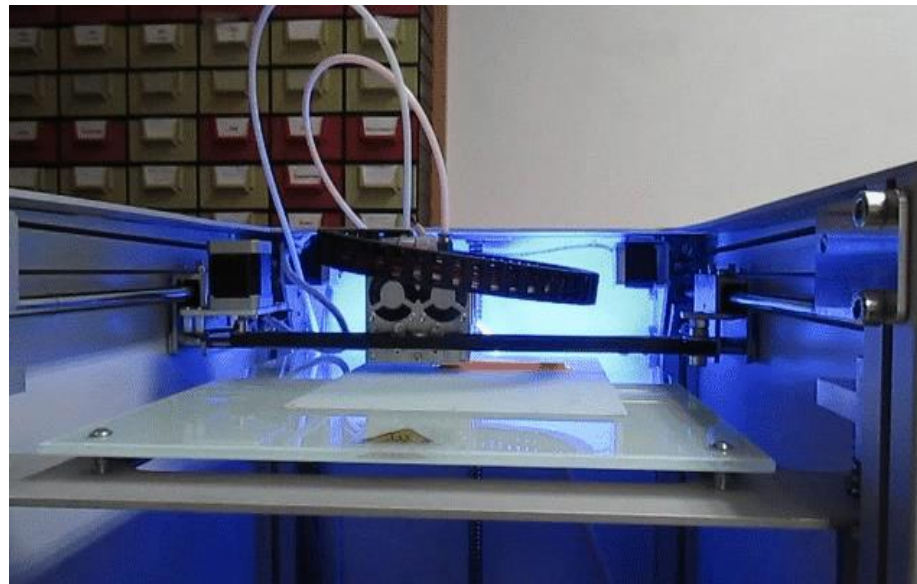
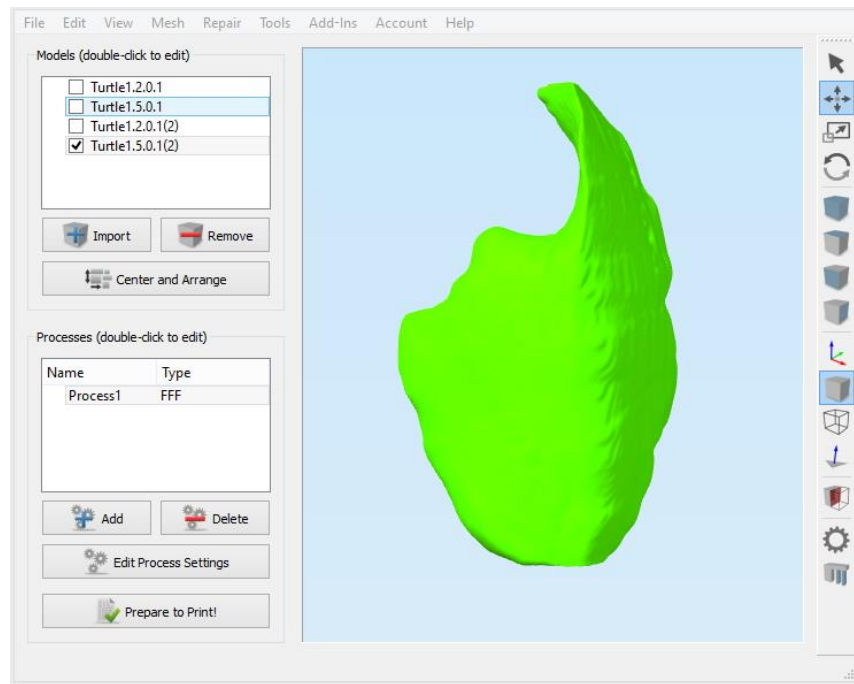


mirror image



morphological
corrections

3D printing



Exploitation



Conclusions

- The developed database will serve as an imaging data source for researchers, working on breast imaging and early breast cancer detection with the help of existing or newly developed imaging modalities.

Acknowledgments



This project has received funding from the *European Union's Horizon 2020 research and innovation programme* under grant agreement No 692097.

