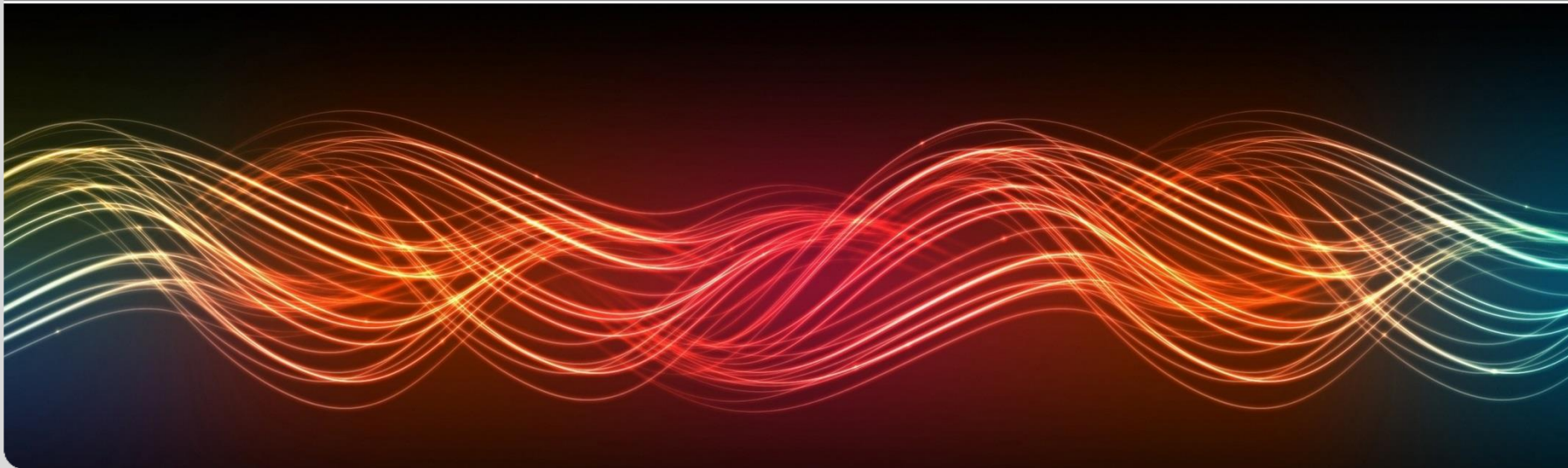


Automated Analysis of X-ray Data

Alexey Ershov

INSTITUTE FOR PHOTON SCIENCE AND SYNCHROTRON RADIATION (IPS)



Outline

- Automated Analysis of X-ray Data
 - X-ray Imaging
 - Analysis of Dynamical X-ray Data
 - Application Examples
- Collaboration between TPU and KIT
 - Research Directions
 - Possibilities for Students
- Current Topics and Tasks
- Lecture: “Image Acquisition Methods and Image Analysis”

Automated Analysis of X-ray Data

X-Ray Imaging

X-rays are electromagnetic radiation:

- Wavelength in the range 0.01 to 10 nm
- Energies: 100 eV to 100 keV

Interaction of X-rays with the matter:

- Photoelectric absorption
- Scattering

More info on the lecture of Prof. Tilo Baumbach

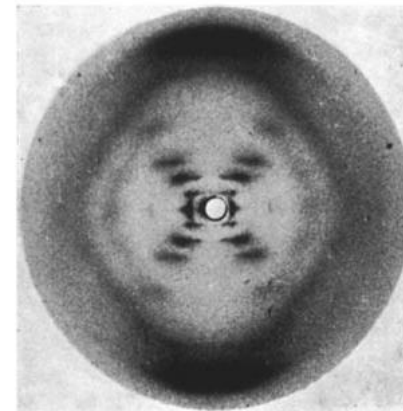
„**Modern X-ray Physics**“

X-ray application:

- X-ray crystallography
- X-ray astronomy
- X-ray microscopy
- X-ray fluorescence
- **Radiography**
- **Computed Tomography (CT)**
- Security systems



First X-ray radiograph. Source: Wikipedia



DNA structure. Source: Wikipedia

X-Ray Imaging

X-rays are electromagnetic radiation:

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Interaction of X-rays with the matter:

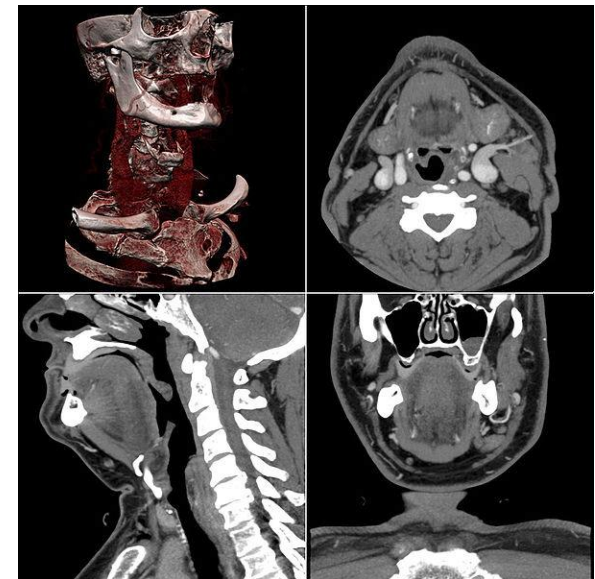
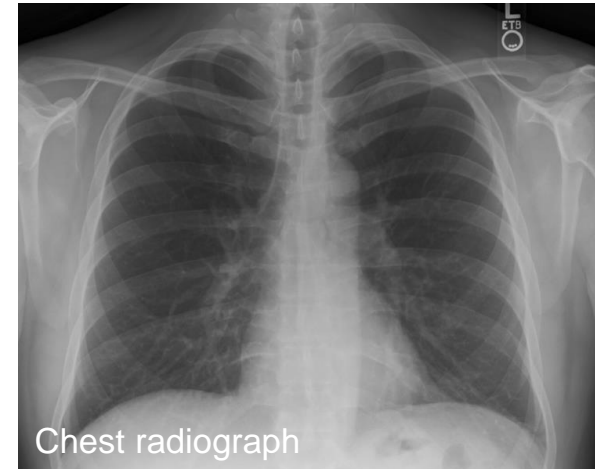
- Photoelectric absorption
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„**Modern X-ray Physics**“

X-ray application:

- X-ray crystallography
- X-ray astronomy
- X-ray microscopy
- X-ray fluorescence
- **Radiography**
- **Computed Tomography (CT)**
- Security systems



CT of the neck region

ANKA Synchrotron



Time-resolved X-Ray Imaging

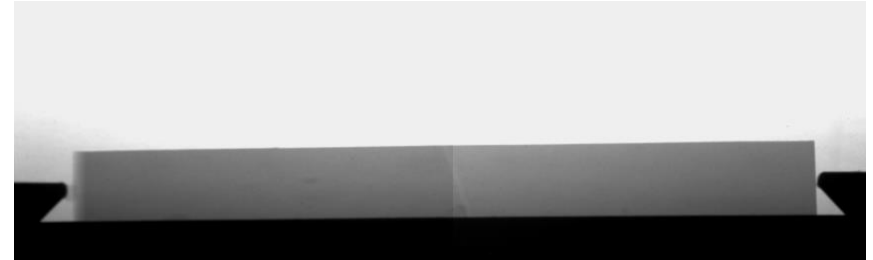
X-ray imaging allow to investigate **internal** structure of **time-varying** processes.

Study examples:

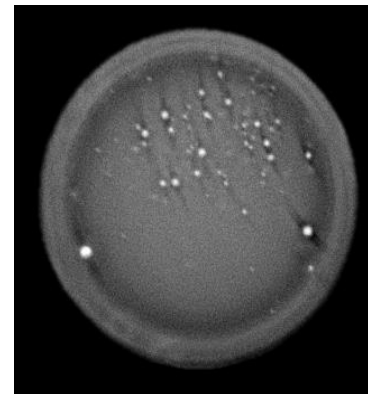
- Evolution of structures
- Fabrication processes
- Living organisms
- Liquid flows, Diffusion processes and **many more...**

Time-resolved X-ray data analysis:

- Study of the dynamics
- Motion analysis and Object tracking
- Motion-based segmentation



Metal foaming process. *Source: TU Berlin*



Crack growth in flip-chips.



Moving bug.
Source: State Museum of National History, Karlsruhe

We aim to extract dynamical information using **optical flow** methods.

Optical Flow

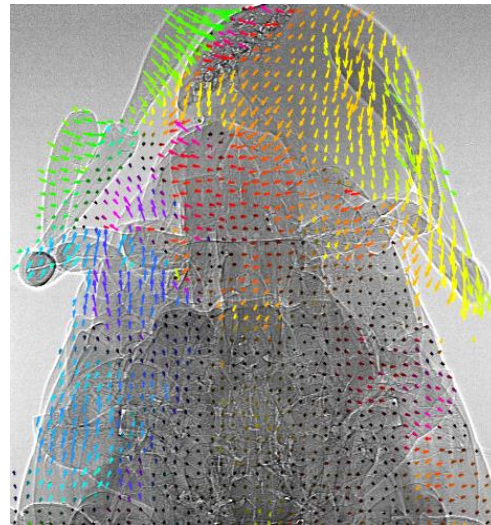
Optical flow problem is related to the field of **Computer Vision**.

Given: Two images $\mathbf{f} = (f_{1,1}, \dots, f_{N,M})^\top$ and $\mathbf{g} = (g_{1,1}, \dots, g_{N,M})^\top$

Task: Displacement field $\mathbf{u} = (u_{1,1}^\top, \dots, u_{N,M}^\top)^\top$ which maps all the pixel from the first frame to their new positions on the second frame



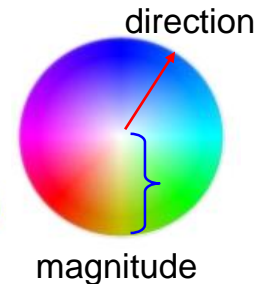
chewing cockroach sequence



vector visualization



motion field using **color coding**



A number of well-established optical flow methods exists.

Our choose: **Variational** optical flow methods

Optical Flow Model

General idea: Use assumptions about image data and motion model.

First idea: brightness constancy assumption

$f(x, y, t)$ - color of a pixel on the first image

$f(x, y, t+1)$ - color of a pixel on the second image

$f(x, y, t) - f(x+u, y+v, t+1) = 0$ u, v - unknown displacements

Second idea: Assume the smoothness of the flow field.

$\square u = \begin{bmatrix} u_x \\ u_y \end{bmatrix}$ - spatial gradient $|\square u| = \sqrt{u_x^2 + u_y^2}$ - magnitude of gradient $|\square u|^2 \rightarrow 0$

The variational methods compute the **displacement field** as a minimiser of the energy functional:

$$E(u, v) = \int_{\Omega} \underbrace{(f(x, y, t) - f(x + u, y + v, t + 1))^2}_{\text{data term}} + \alpha \underbrace{(|\nabla u|^2 + |\nabla v|^2)}_{\text{smoothness term}} dx dy .$$

Many advanced models and model assumptions are developed for state-of-the-art optical flow methods...

Solution

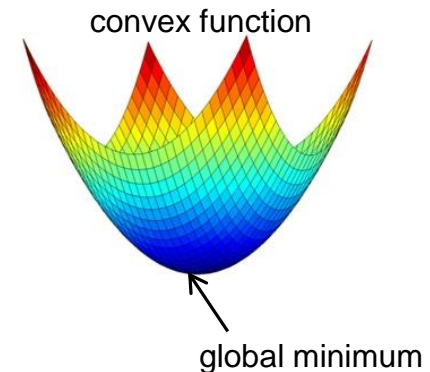
How to find the minimizer for the constructed energy functional?

$$F(u, v) = \int_{\Omega} \underbrace{(f(x, y, t) - f(x + u, y + v, t + 1))^2}_{\text{data term}} + \alpha \underbrace{(|\nabla u|^2 + |\nabla v|^2)}_{\text{smoothness term}} dx dy .$$

Idea: Use tricks from mathematics

If functional is **convex** \rightarrow a unique, global minimum exists and can be derived directly using **Euler-Lagrange equations:**

$$\begin{aligned} 0 &\stackrel{!}{=} F_u - \frac{\partial}{\partial x} F_{u_x} - \frac{\partial}{\partial y} F_{u_y} , & \text{with (reflecting) Neumann boundary conditions:} \\ 0 &\stackrel{!}{=} F_v - \frac{\partial}{\partial x} F_{v_x} - \frac{\partial}{\partial y} F_{v_y} & \mathbf{n}^\top \nabla u = 0 \\ & & \mathbf{n}^\top \nabla v = 0. \end{aligned}$$



Next step: Discretize the Euler-Lagrange equations on rectangular grid.

Solve system of equations $Ax = b$, by using an approximation and **iterative** scheme

$$\mathbf{x}^{k+1} = A_1^{-1}(\mathbf{b} - A_2 \mathbf{x}^k) \quad (\text{Gauss -Seidel method})$$

We use state-of-the-art, highly accurate and robust optical flow methods.

Developmental Biology

African Clawed Frog (*Xenopus laevis*) - Vertebrate model organism



adult African clawed frog

embryo development of *Xenopus laevis*.

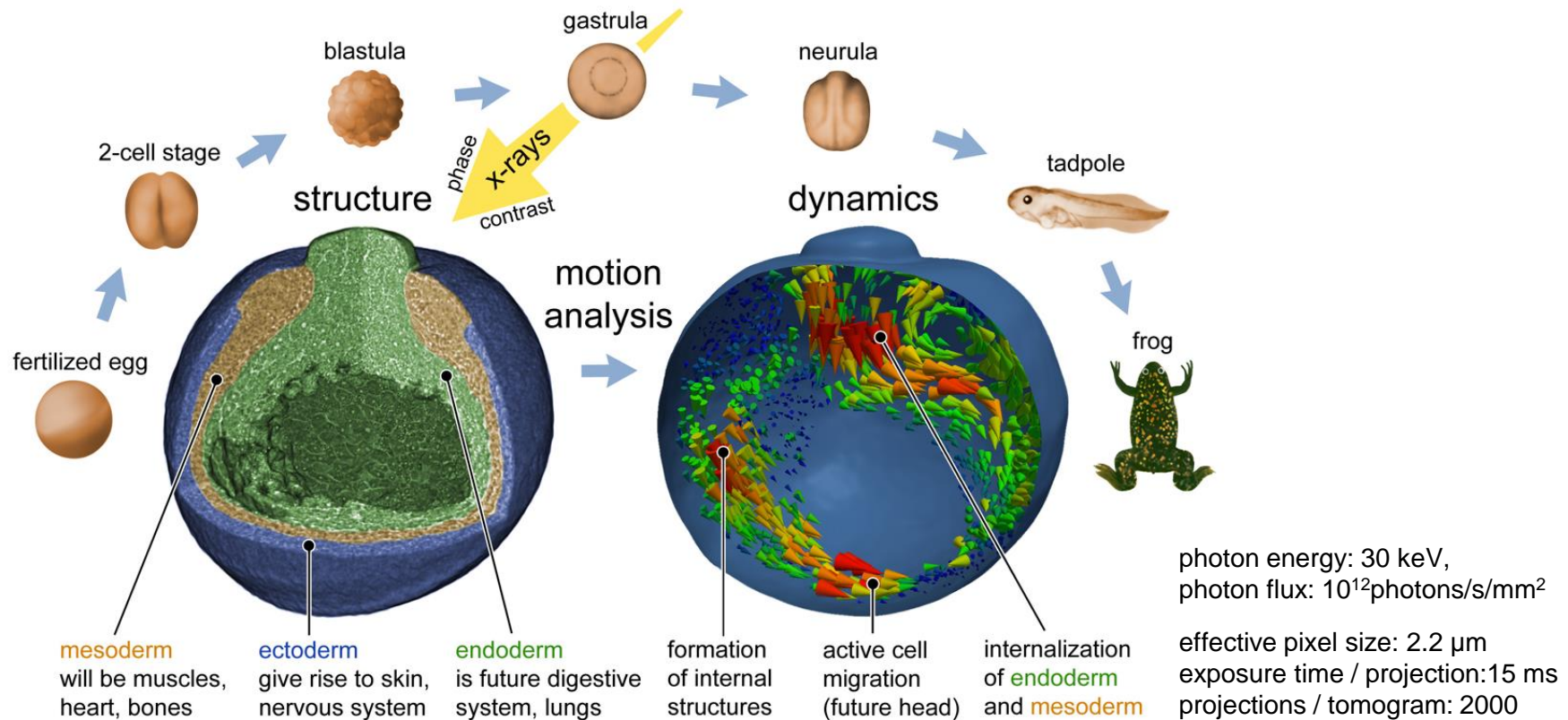
- Unlimited availability
→ over 1000 eggs per day
- Homogeneous population
→ no individual factors
- Manipulation
→ injections, transplantations,...
- Experiments within the embryo
(*in vivo*) and in petri dish (*in vitro*)



In-vivo X-ray Study of Embryo Development



Application: Analyze morphogenetic movements during embryogenesis.
Imaged by *in-vivo* phase-contrast 4D X-ray microtomography.

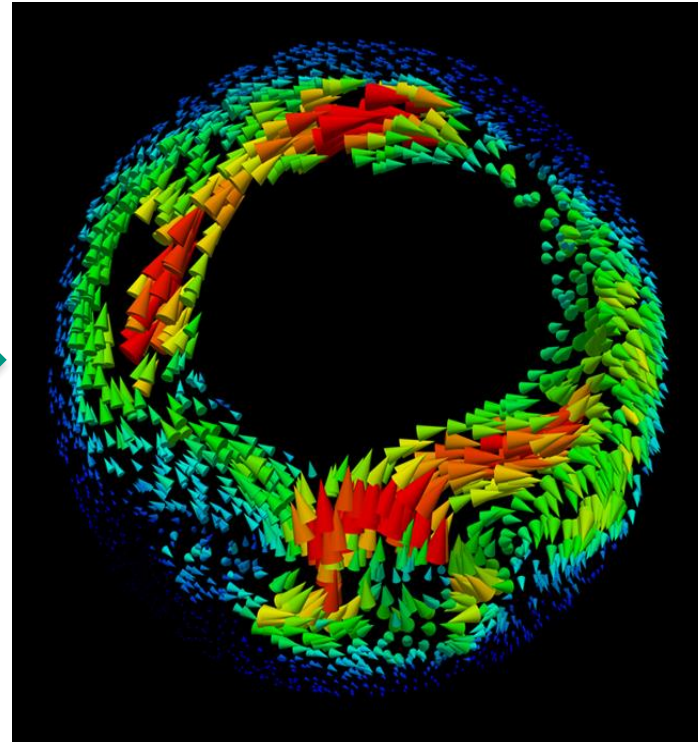
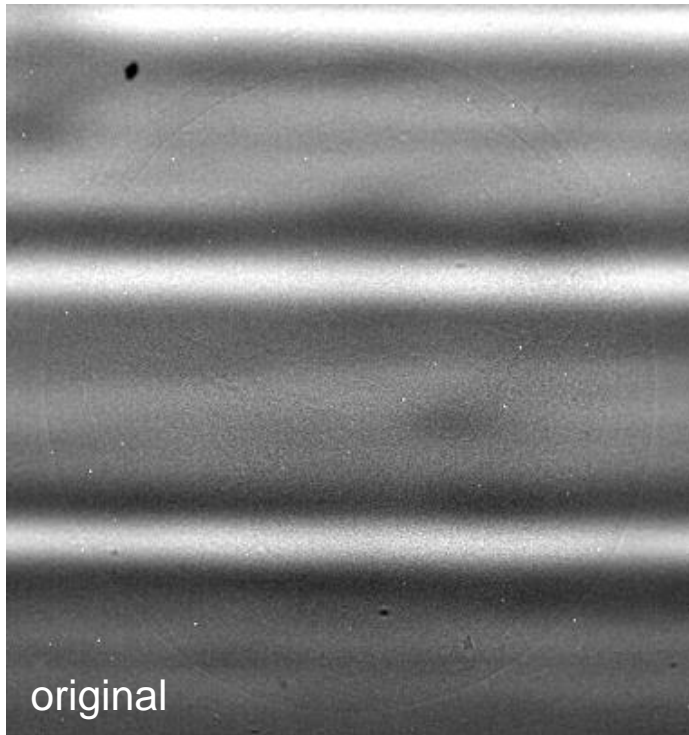


Problem: Complexity of movements and many interconnected events

Solution: Use multi-scale (**hierarchical**) motion analysis approach

Data Processing Pipeline

Aim: Correct image artifacts and enhance data quality



Data Correction



Reconstruction



Structure



Motion

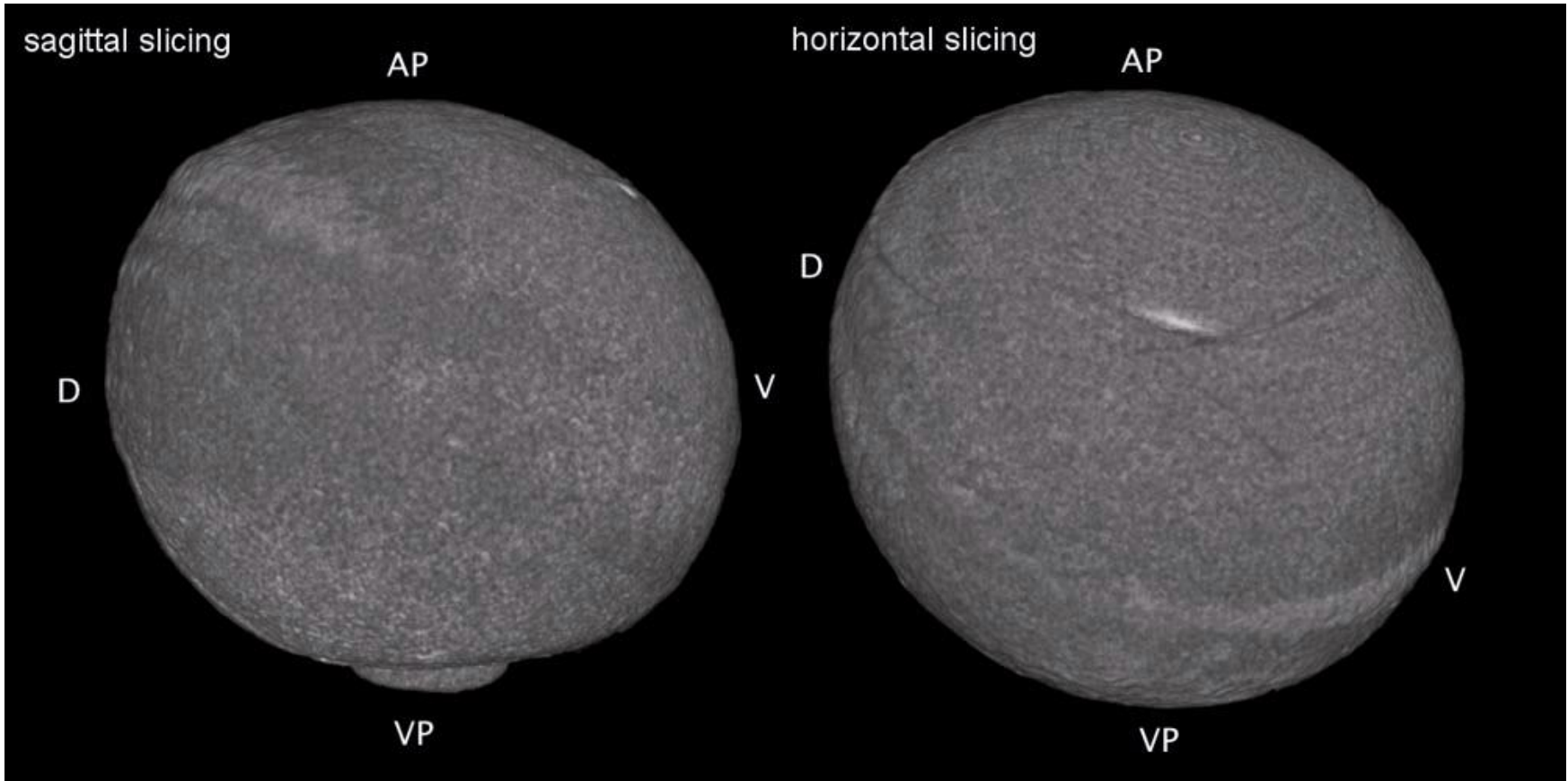
Flat field correction
Noise / artifacts removal
Brightness correction

Phase retrieval
3D reconstruction
Background removal

Segmentation
3D rendering
Labeling

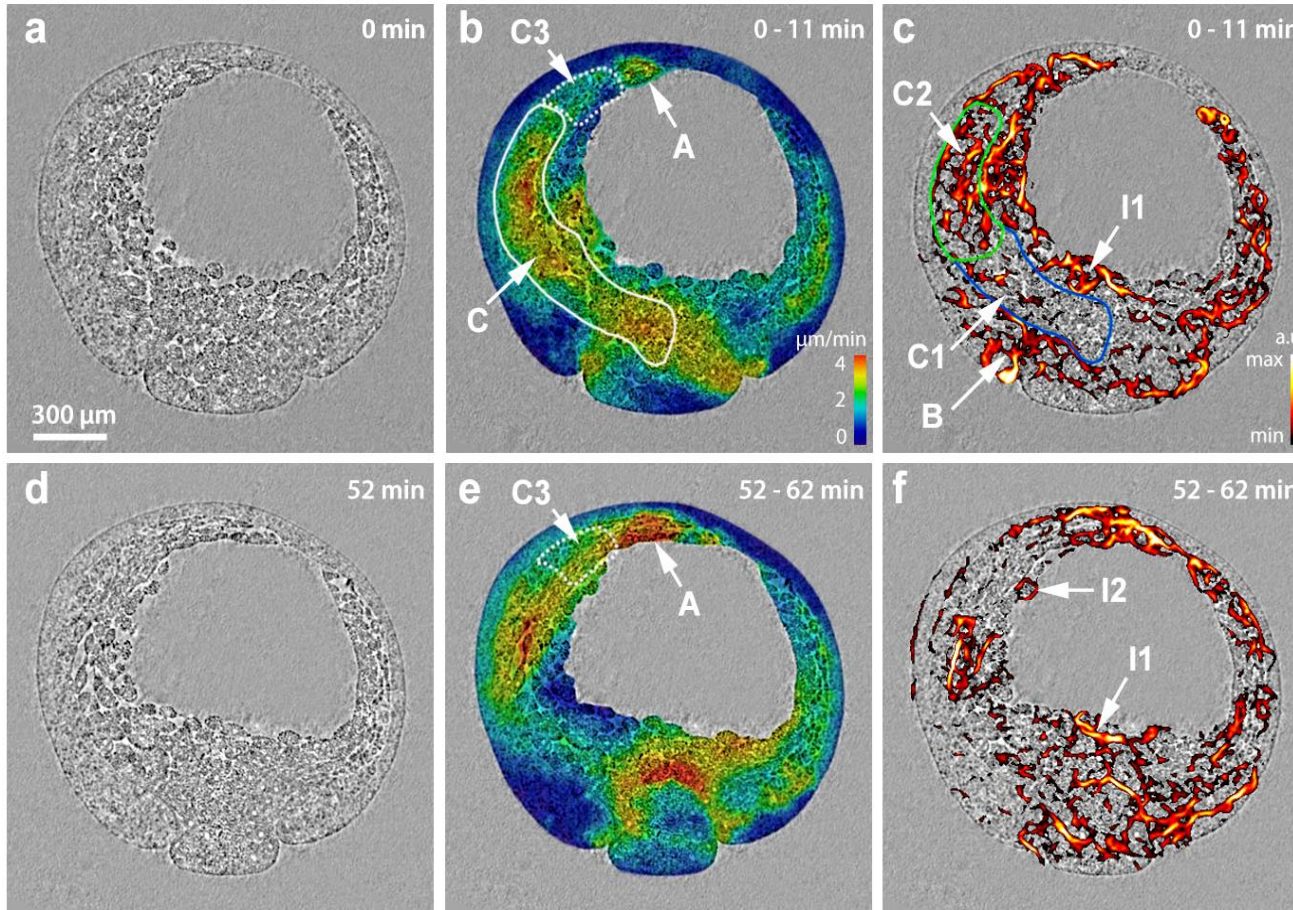
Optical flow

3D Rendering of Entire Embryo



Differential motion

Aim: Distinguish collective and individual cells motion; passive and active movements



\vec{v} - motion field

v_x, v_y, v_z - components

$\vec{\nabla}$ - spatial gradient

Measures

$|\vec{v}|$ - motion magnitude

$G \equiv |\vec{\nabla}v_x| + |\vec{\nabla}v_y| + |\vec{\nabla}v_z|$

- motion non-uniformity

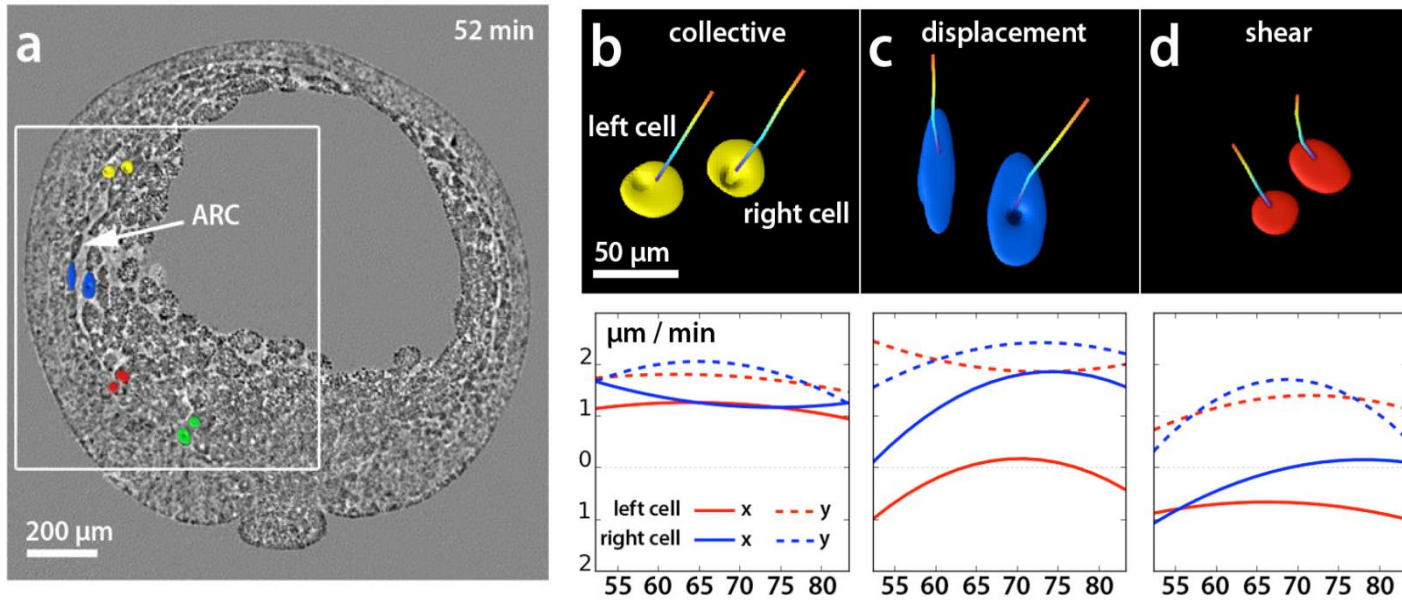
tomographic slice

motion magnitude

motion non-uniformity

Analyzing individual cells

Aim: Track individual cells, analyze their dynamics to study interaction mechanisms.

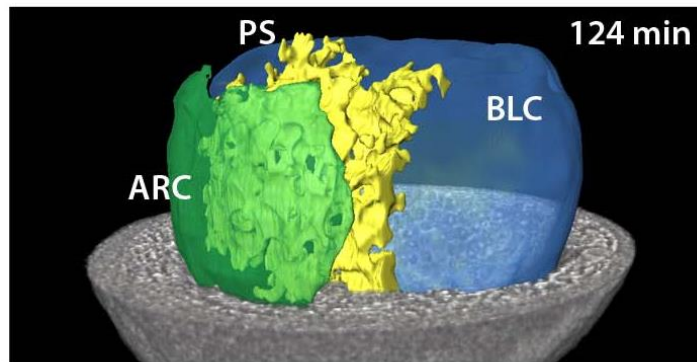
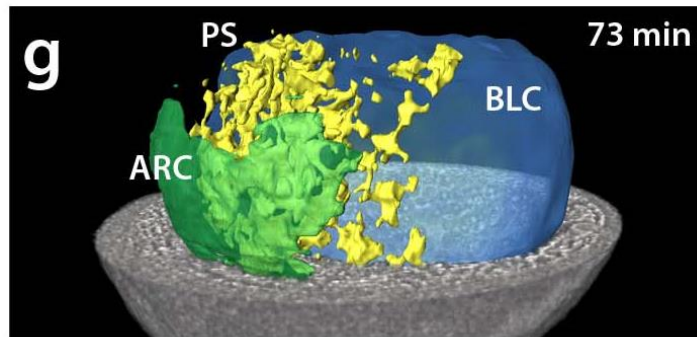


J. Moosmann, A. Ershov, V. Altapova, T. Baumbach, M. Prasad, C. LaBonne, X. Xiao, J. Kashef, and R. Hofmann
X-ray phase-contrast in vivo microtomography probes new aspects of Xenopus gastrulation
Nature **497** (7449) , 374—377 (2013)

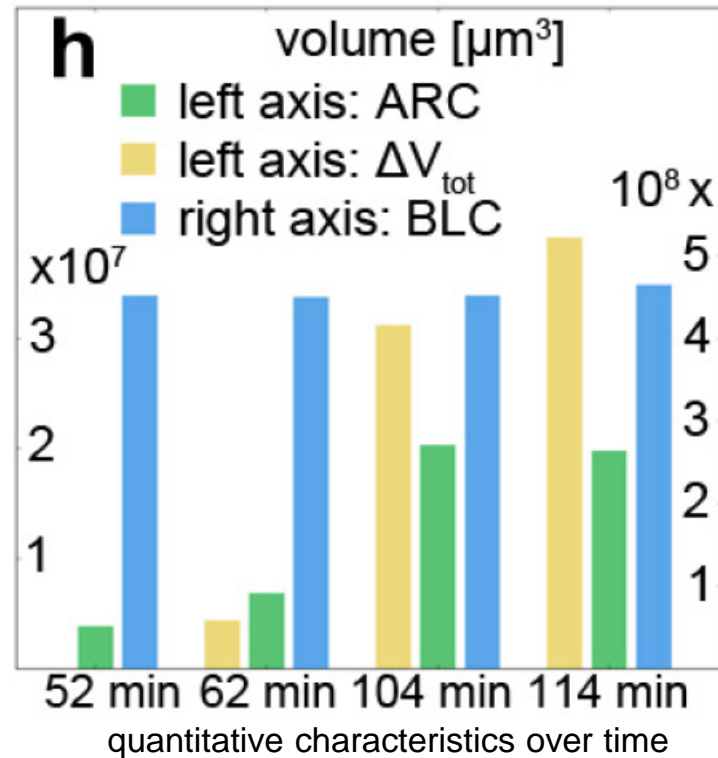
Moosmann, J.; Ershov, A.; Weinhardt, V.; Baumbach, T.; Prasad, M. S.; LaBonne, C.; Xiao, X.; Kashef, J. & Hofmann, R.
Time-lapse X-ray phase-contrast microtomography for in vivo imaging and analysis of morphogenesis,
Nature Protocols **9** (2) , 294—304 (2014)

Changes in internal structures

Aim: Analyze changes in internal structures to get insights about embryo morphogenesis.



changes in internal structures

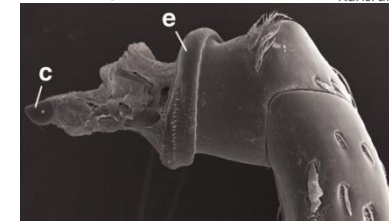


J. Moosmann, A. Ershov, V. Altapova, T. Baumbach, M. Prasad, C. LaBonne, X. Xiao, J. Kashef, and R. Hofmann
X-ray phase-contrast in vivo microtomography probes new aspects of Xenopus gastrulation **Nature** 2013

In-vivo X-ray 4D Cinetomography

Application: Analyze function of hip joints in living insect.

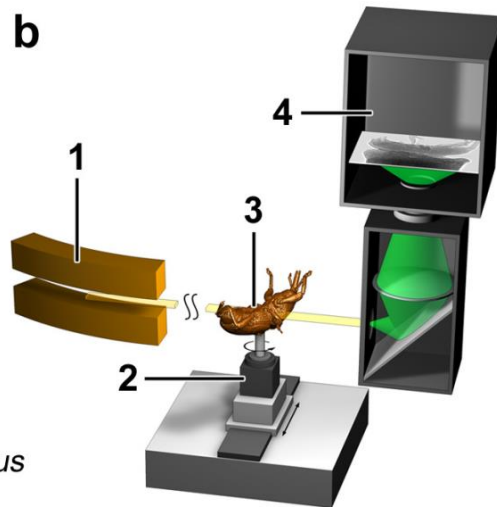
In-vivo X-ray Cinetomography =
Ultra-fast 4D X-ray Imaging + Automated Data Analysis



biological screw



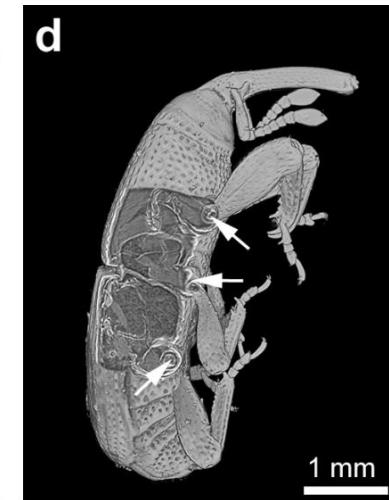
Sitophilus granarius



experimental setup



radiographic projection

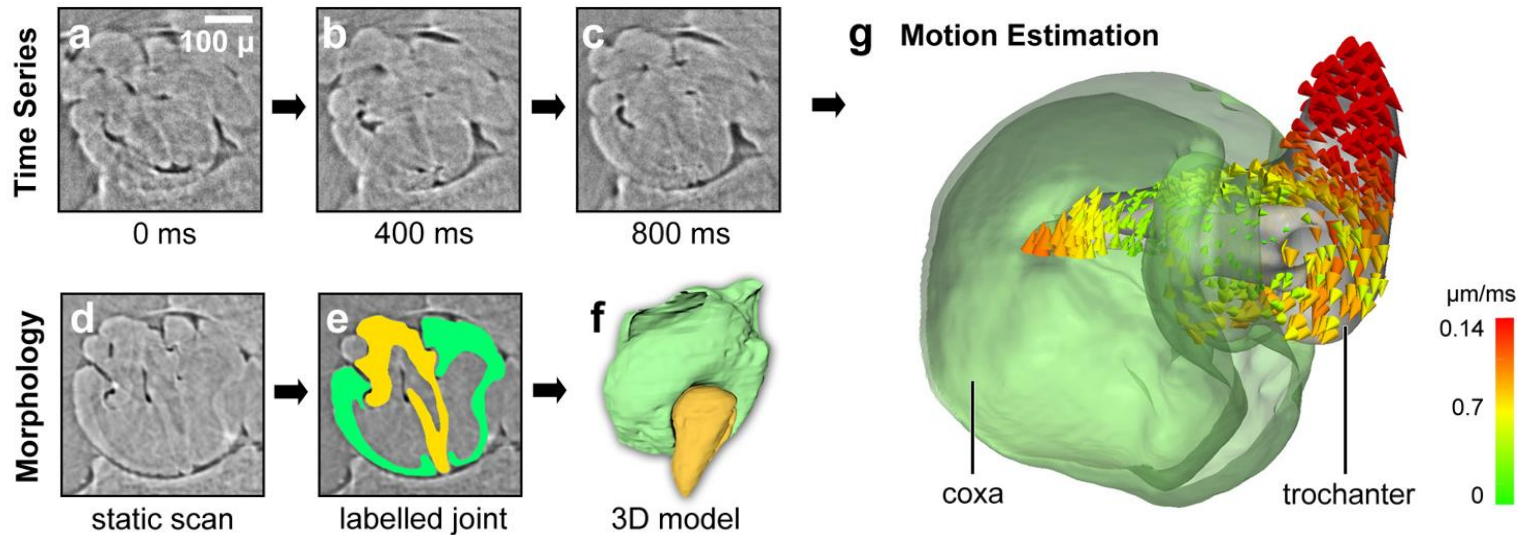


volume rendering



photon energy: 9.6–24 keV
pixel size: 1.2 μm
imaging rate: 1500 projection / sec
projections / tomogram: 200
tomograms / sec: 7.5 volumes

Motion Analysis and Kinematics



Problem: The data quality is **not sufficient** to compute **reliable** motion field

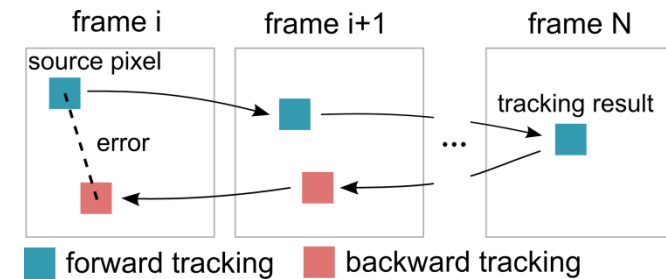
Robust method to extract kinematics:

- Distribute landmarks for both parts
- Track landmarks in forw. and back. directions
- Filter only reliable landmarks
- Register landmarks from frame i and $i+1$
- Obtain global transformation M_t
- Decompose M_t into

translational and **rotational** components

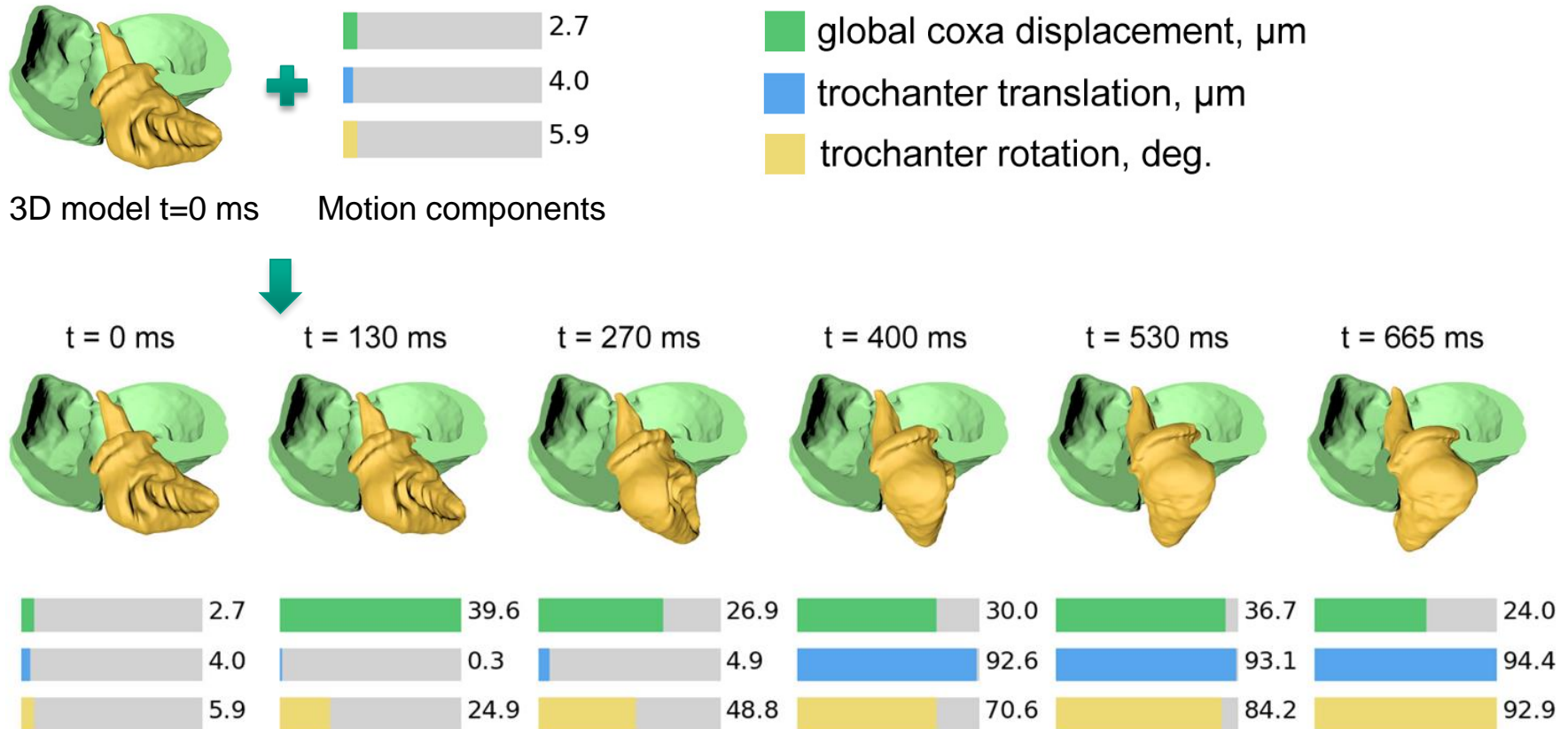
Confidence measure:

Forward-backward cross-check



Morphodynamics

Aim: In-vivo study of morphological dynamics of a screw joint system.

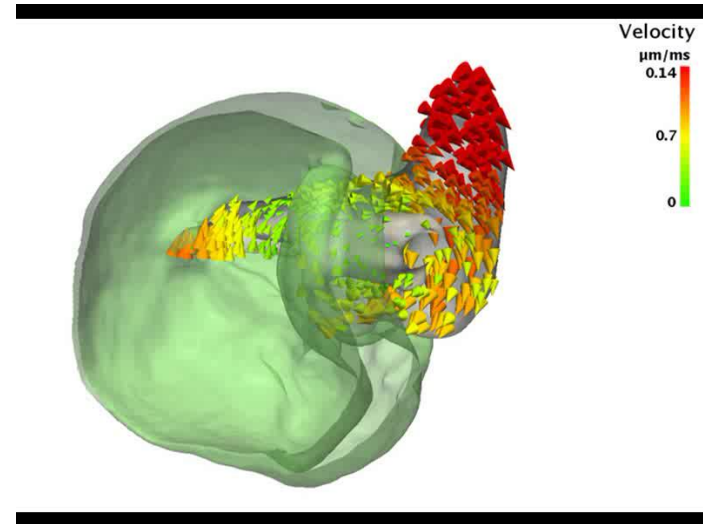


In vivo X-ray 4D Cinetomography for Tracking Morphological Dynamics

T. dos Santos Rolo, A. Ershov, T. van de Kamp, and T. Baumbach

Proceedings of the National Academy of Sciences 2014

In-vivo X-ray 4D Cinetomography



In vivo X-ray 4D Cinetomography for Tracking Morphological Dynamics T. dos Santos Rolo, A. Ershov, T. van de Kamp, and T. Baumbach **PNAS** 2014

Collaboration between TPU and KIT

TPU & KIT: Current Activities

Main research fields:

- Physics
- Informatics

Visiting students (2011 - 2014):

- 7 Bachelor students
- 5 Master/Specialist students
- 4 Guest scientists (PhD)

Current students and scientists:

- 3 Master/Specialist students
- **2 PhD students at KIT**
- 1 Guest scientist from TPU

Collaboration projects:

- **UFO**: Ultra fast X-ray imaging of scientific processes with on-line assessment and data-driven process control
- **ASTOR**: Arthropod structure revealed by ultra-fast tomography and online reconstruction
- **STROBOS-CODE**: Stroboscopic and correlative diffraction imaging



Andrey Shkarin
PhD students at KIT



Dr. Sergey Lazarev,
DESY, Hamburg, Germany



Roman Shkarin
PhD student at KIT



Dr. Venera Weinhardt (Altapova),
University of Heidelberg, Germany

TPU & KIT: Proposals



To strengthen scientific collaboration between TPU and KIT we propose:

Scientific collaboration in 2 research direction:

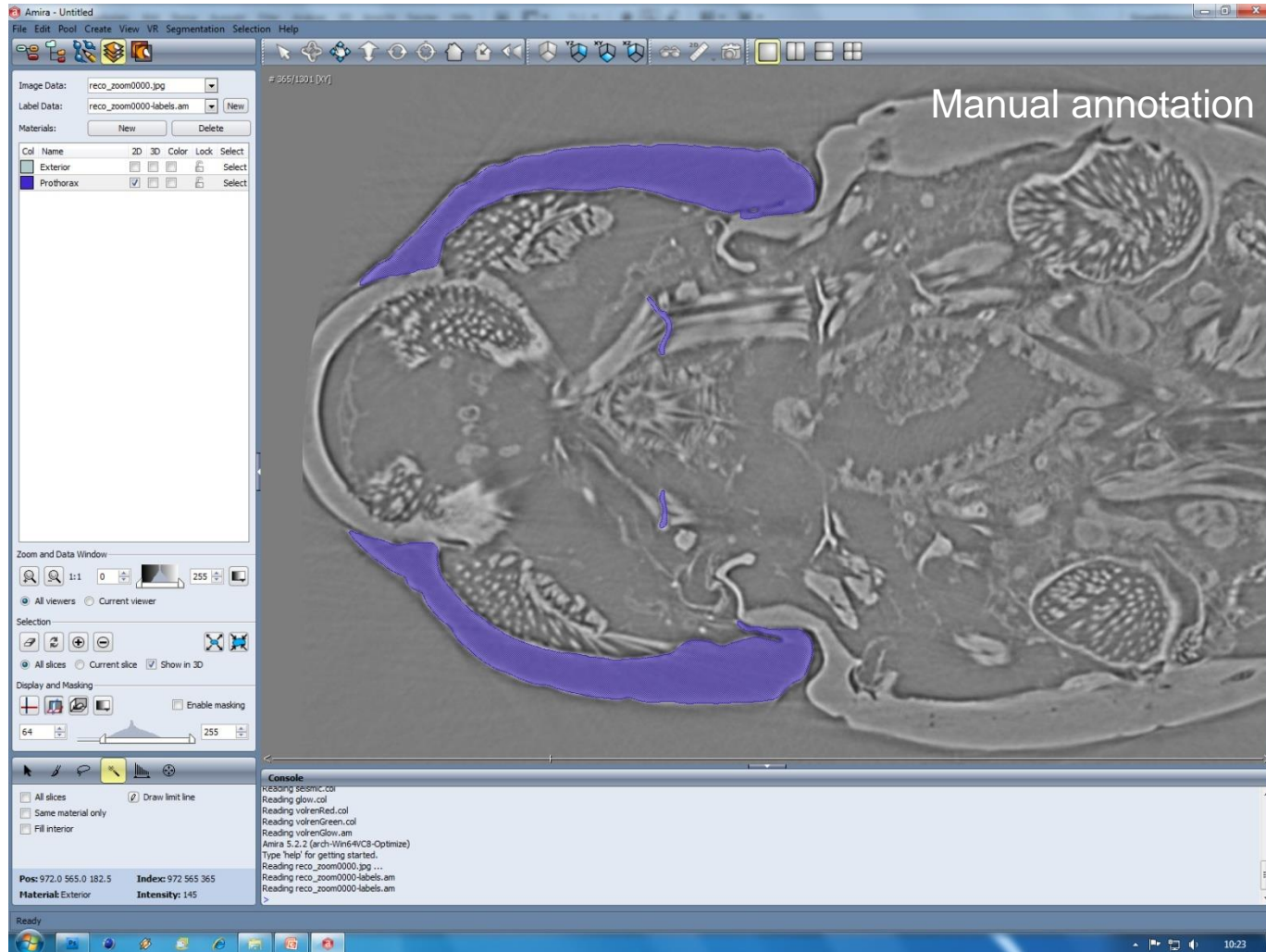
- Image Processing and Data Analysis for Medicine and Visual Inspection Systems
- Motion Analysis and Tracking for Video Processing, Monitoring and Intelligent Systems

- Internships / student practice in KIT, Karlsruhe, Germany
- Topics for scientific projects for students
- Topics and co-supervision of Bachelor/Master thesis
- Scientific collaboration with TPU doctorands
- Joint scientific projects with Institute of Cybernetics

Current Topics and Tasks

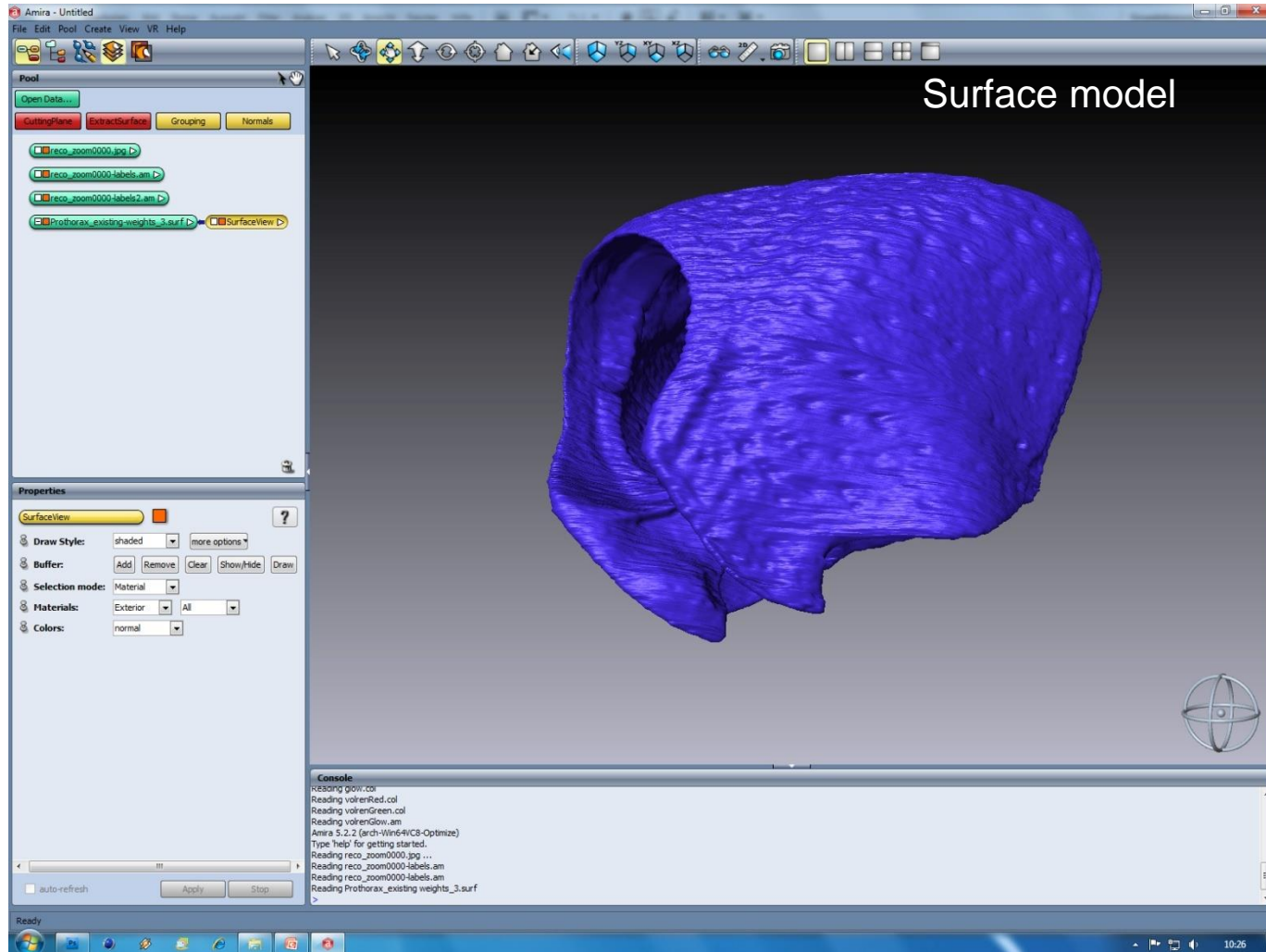
Topic: Image Segmentation

Task: Automated segmentation of structures in materials and biological specimens.



Topic: Image Segmentation

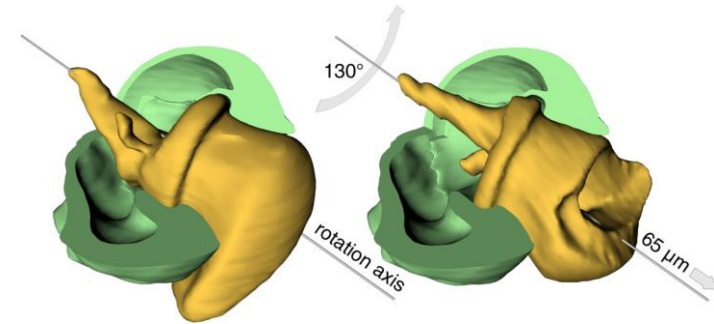
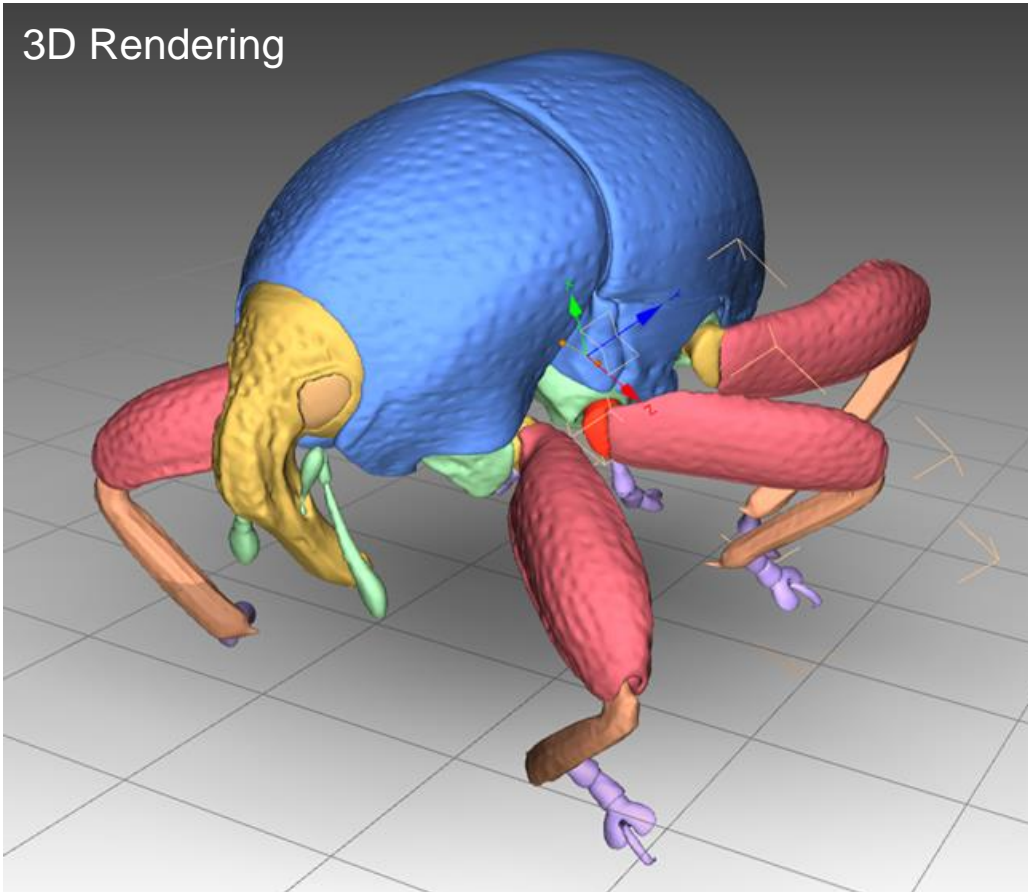
Task: Automated segmentation of structures in materials and biological specimens.



Topic: Image Segmentation

Task: Automated segmentation of structures in materials and biological specimens.

3D Rendering



Biological screw joint



Trigonopterus weevils

Automated segmentation is required for high throughput data analysis!

Topic: Image Segmentation

Automated segmentation methods:

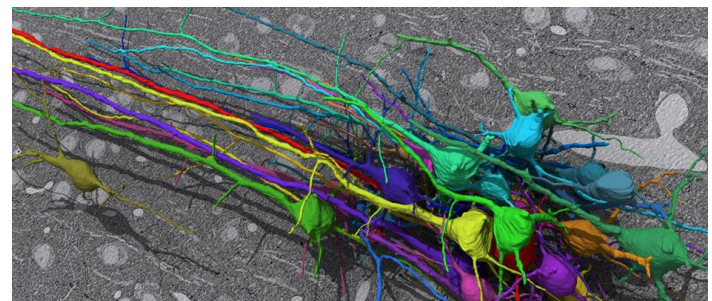
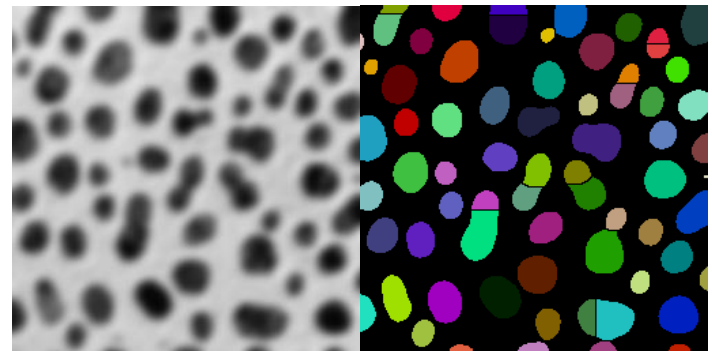
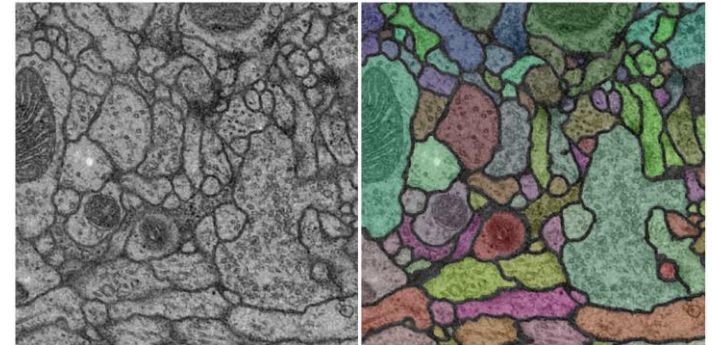
- Grey value thresholding
- Clustering methods
- Edge detection
- Region-growing methods
- Graph partitioning methods
- Watershed segmentation
- Trainable segmentation (NN)

Approaches:

- Automated segmentation
- Semi-automated segmentation
- Multi-level approach

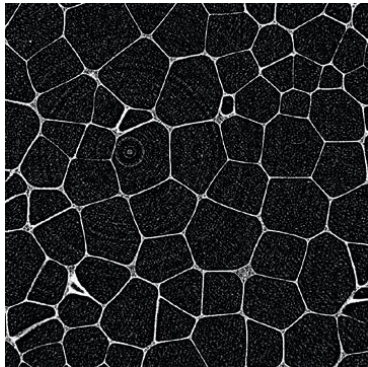
Applications:

- Morphological analysis
- Object detection

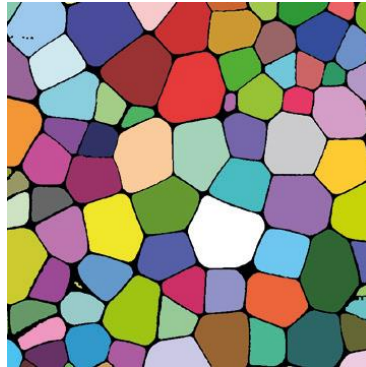


Topic: Morphological Analysis

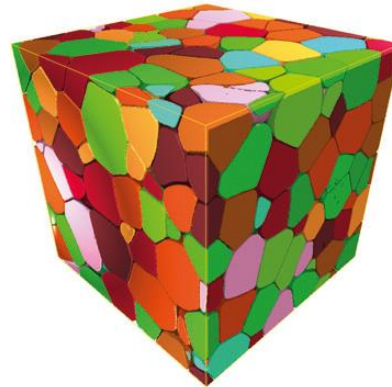
Task: Morphological analysis of porous and fiber materials.



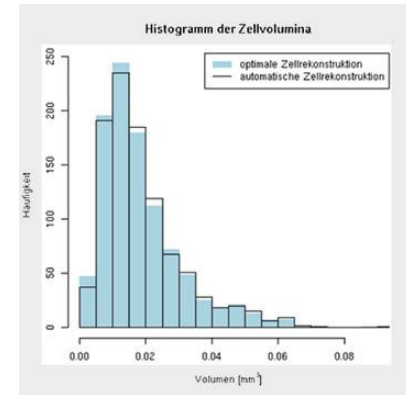
tomographic 2D slice



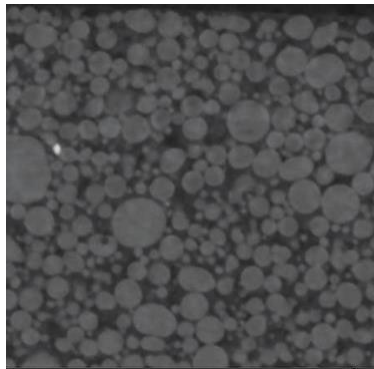
watershed transform



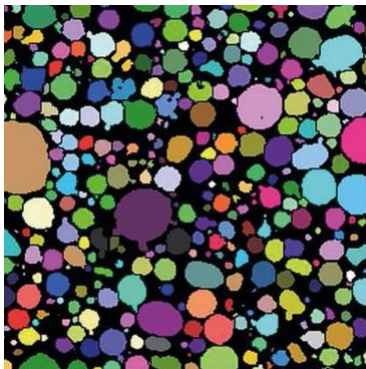
reconstructed cells



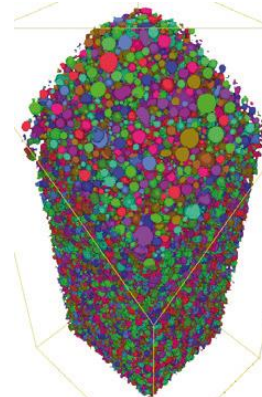
cell volume distribution



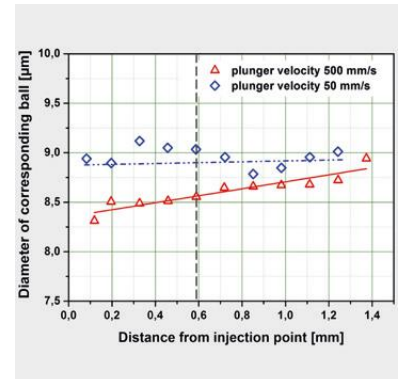
tomographic 2D slice



segmentation



particle system



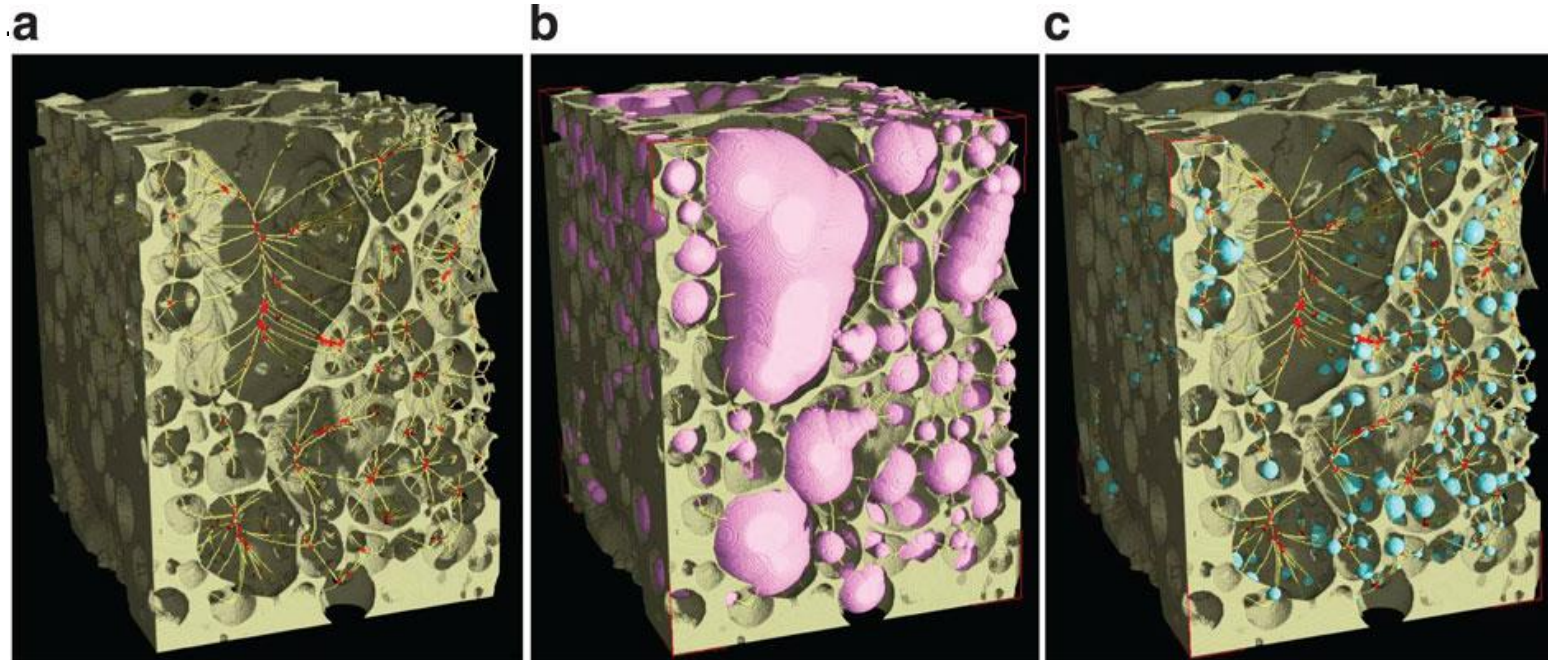
particle size depending on position

MAVI: A modular system for the quantitative analysis of volume images, www.mavi-3d.de

Fraunhofer-Institut für Techno- und Wirtschaftsmathematik ITWM, Kaiserslautern

Topic: Morphological Analysis

Example: Study of bubble growth in basaltic foam



tomographic 2D slice

bubbles volume

pore channel sizes

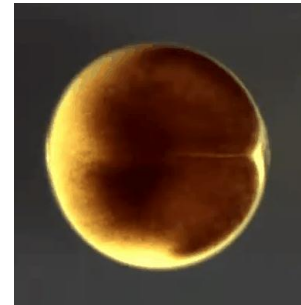
Baker, D. R.; Brun, F.; O'Shaughnessy, C.; Mancini, L.; Fife, J. L. & Rivers, M. (2012),
'A four-dimensional X-ray tomographic microscopy study of bubble growth in basaltic foam', Nat Commun 3

Topic: Digital Atlases

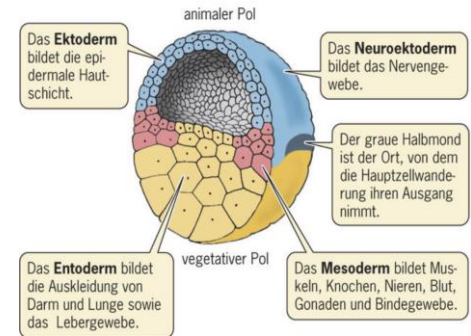
Task: Create digital atlases of model organisms (*Xenopus*, *Medaka*) to study anatomy, pathology, phenotypes and many biological questions.



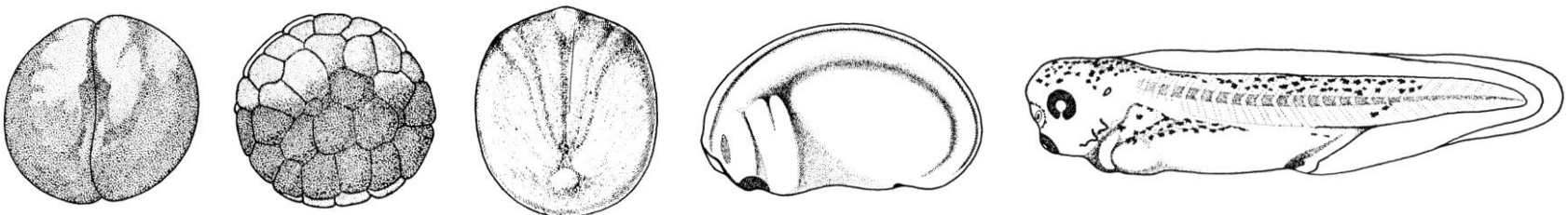
African Clawed Frog (*Xenopus laevis*)



Embryo development of *Xenopus laevis*.



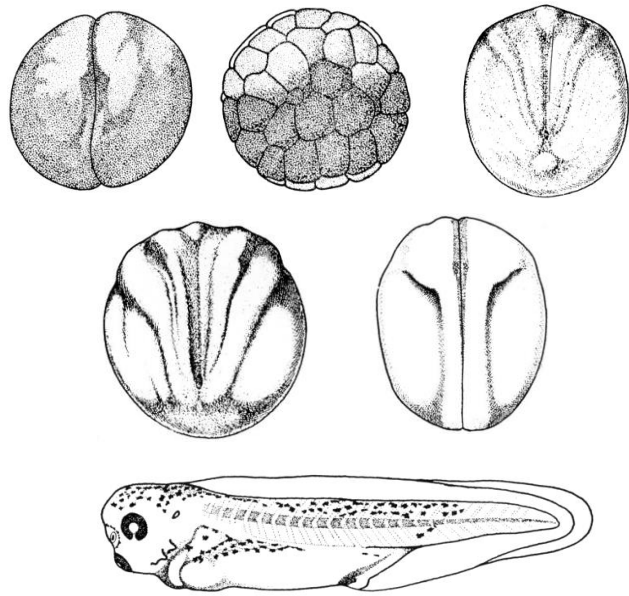
Aus Purves/Sadava/Orians/Heller, Biologie, 7. Aufl., © 2006 Elsevier GmbH



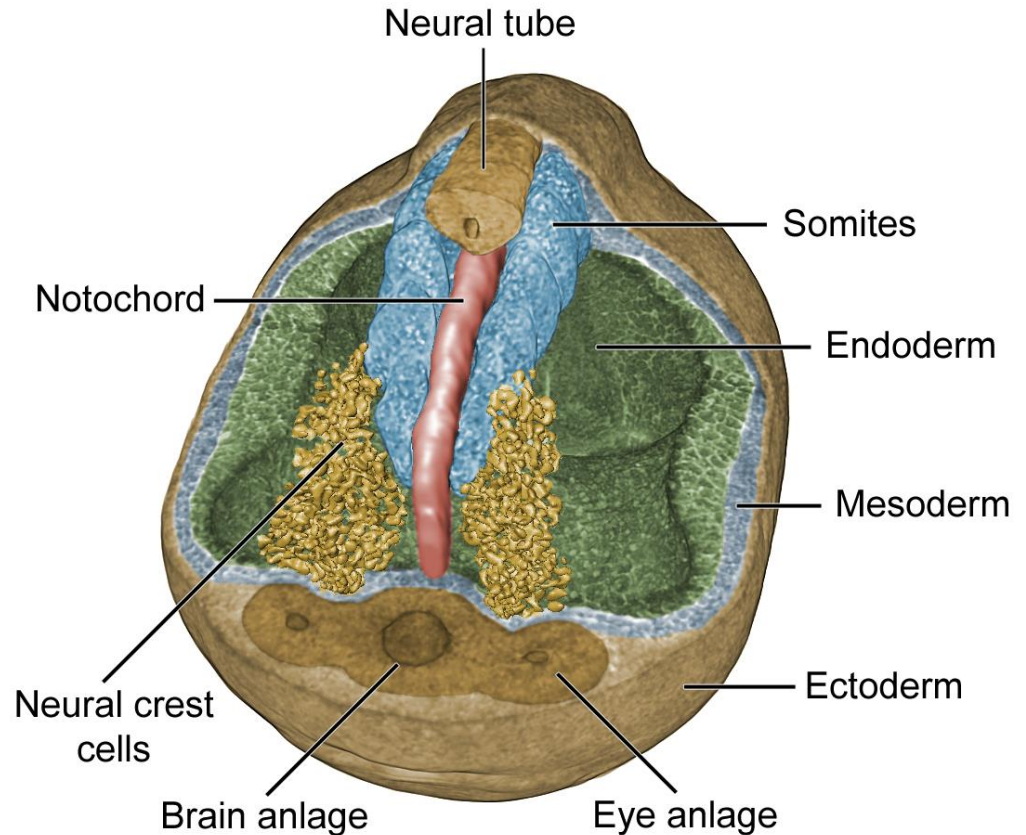
Current *Xenopus* atlas on the xenbase.org website

Topic: Digital Atlases

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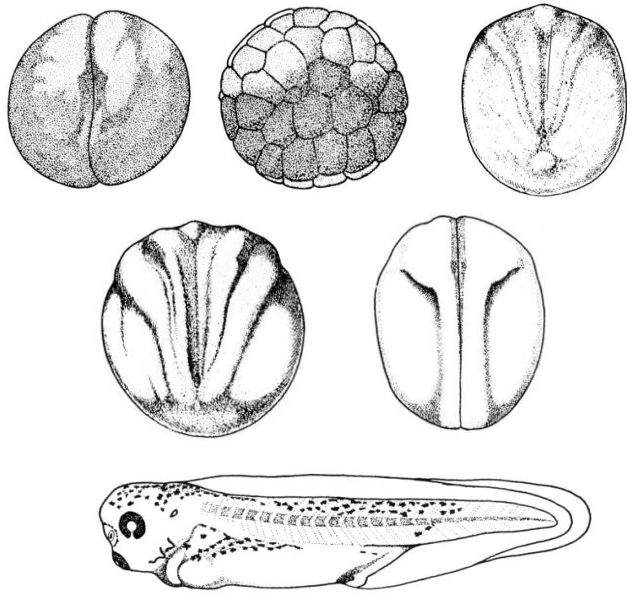


Current *Xenopus* atlas
on the Xenbase website

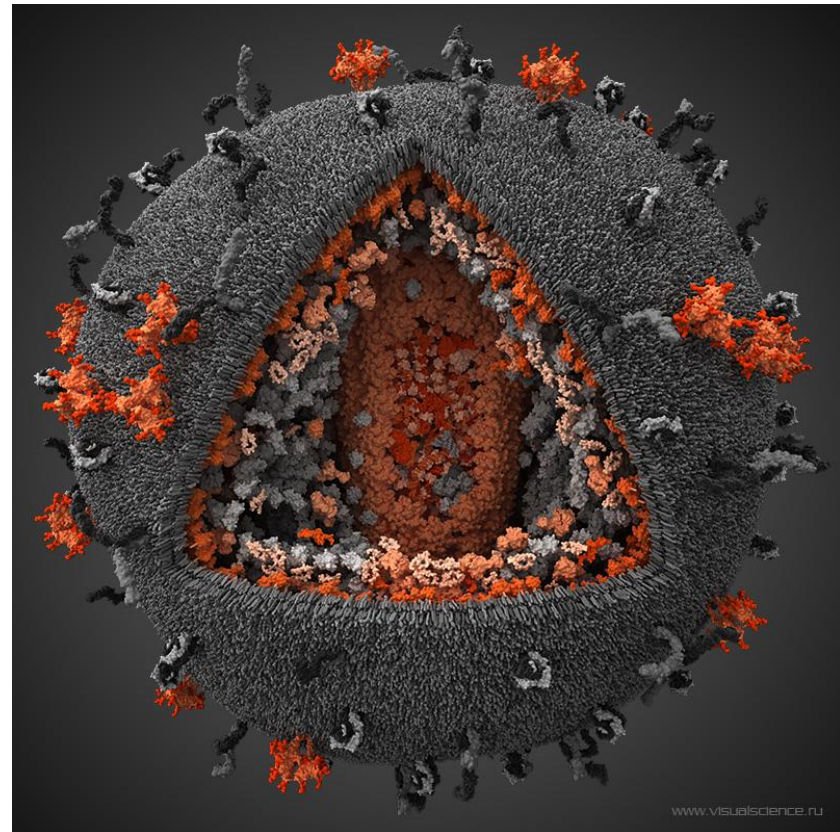


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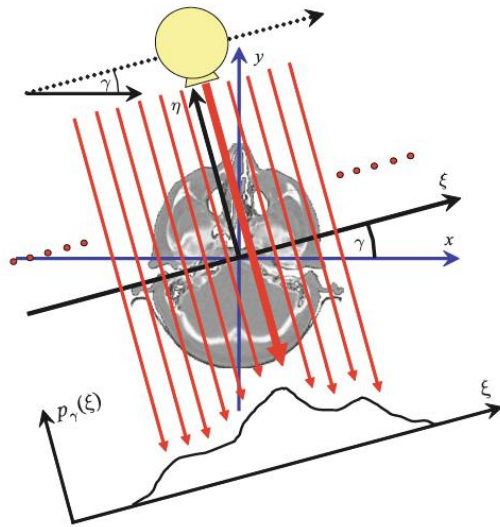
Current *Xenopus* atlas
on the Xenbase website



Inspiration: Human Immunodeficiency Virus (HIV) model
visual-science.com, Russia

Topic: Tomographic Reconstruction

Task: Reconstruct a 3D object from a series of radiographic images taken at different angles.



parallel beam geometry
line integrals of rays

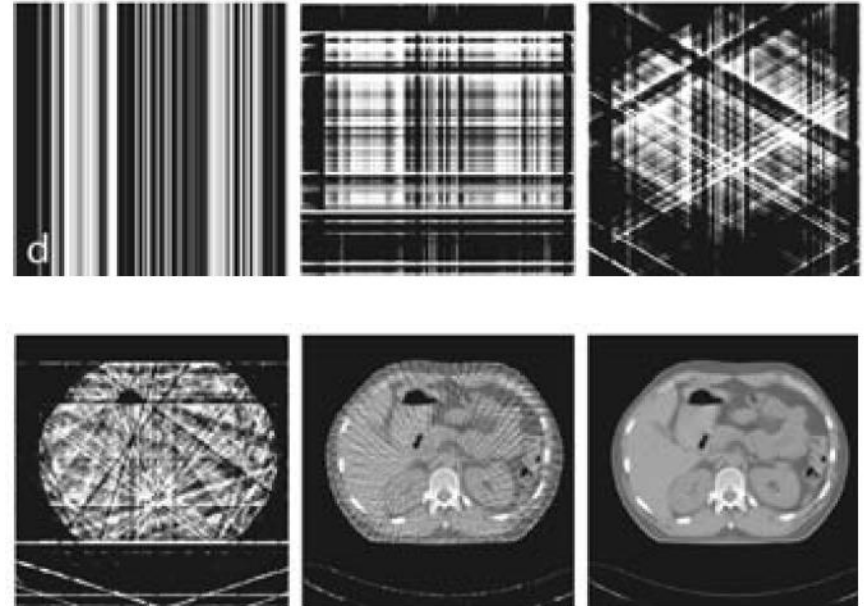
Attenuation: $I = I_0 \exp\left(-\int \mu(x, y) ds\right)$

Example of reconstruction using: 1,2,3,10,45,180 projections

Total attenuation along the ray: $p(r, \theta) = \ln(I/I_0) = -\int \mu(x, y) ds$

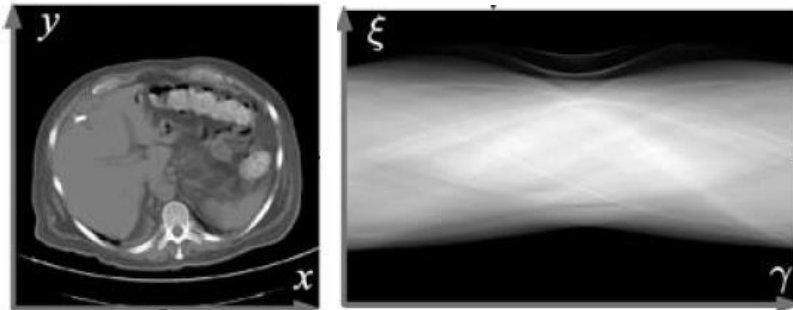
For coordinate system position is given : $x \cos \theta + y \sin \theta = r$

Radon transform: $p(r, \theta) = \int_{-\infty}^{\infty} \int_{-\infty}^{\infty} f(x, y) \delta(x \cos \theta + y \sin \theta - r) dx dy$ Reconstruct original object $f(x, y)$

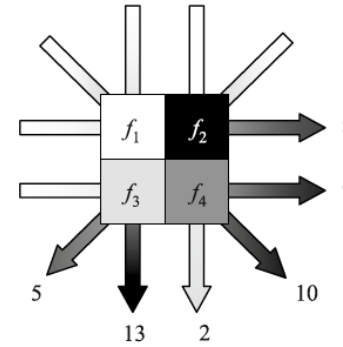


Topic: Tomographic Reconstruction

Task: Reconstruct a 3D object from a series of radiographic images taken at different angles.



Fourier based methods

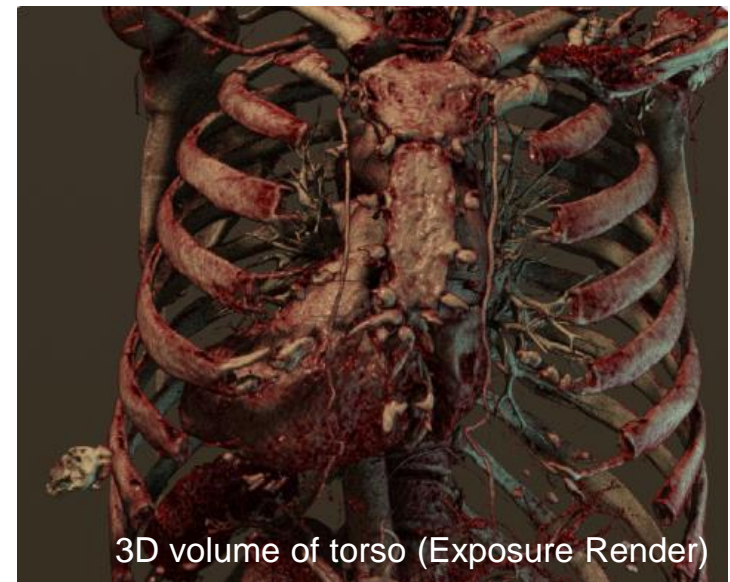


Algebraic reconstruction techniques (ART)

$$\begin{pmatrix} 0 & 1 & 1 & 0 \\ 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 \\ 1 & 0 & 0 & 1 \\ 0 & 0 & 1 & 1 \\ 1 & 1 & 0 & 0 \end{pmatrix} \begin{pmatrix} f_1 \\ f_2 \\ f_3 \\ f_4 \end{pmatrix} = \begin{pmatrix} 5 \\ 13 \\ 2 \\ 10 \\ 7 \\ 8 \end{pmatrix}$$

Aims for reconstruction algorithms:

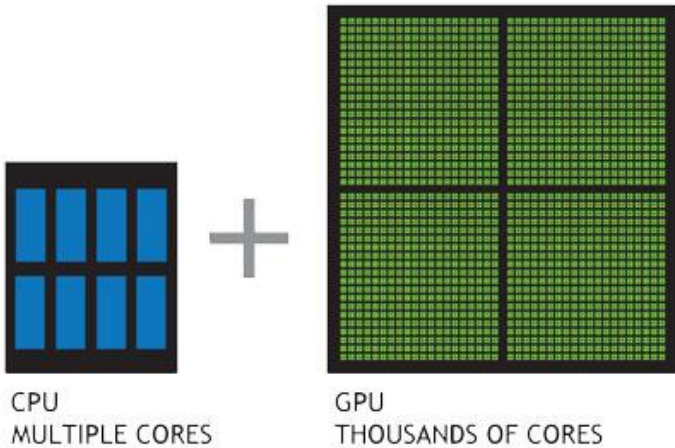
- Improve quality of reconstruction:
 - Robust to noise and artifacts
 - Take into account additional information
- **Reconstruction of dynamical data:**
 - Reduction of motion artifacts
- **Reduce number of projections:**
 - Reduce dose for biological specimens
 - Decrease acquisition time



3D volume of torso (Exposure Render)

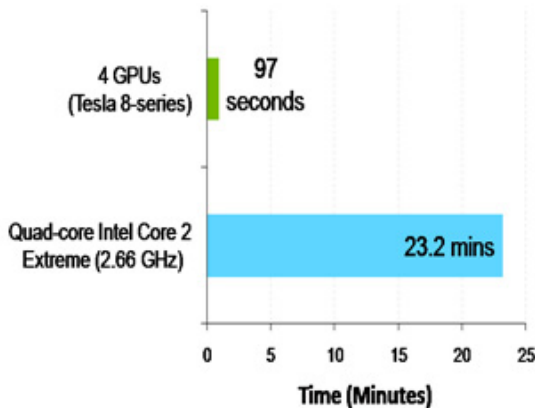
Topic: Computing on GPUs

Task: High-performance image processing algorithms on graphics processing units (GPU).

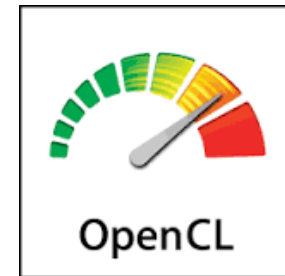
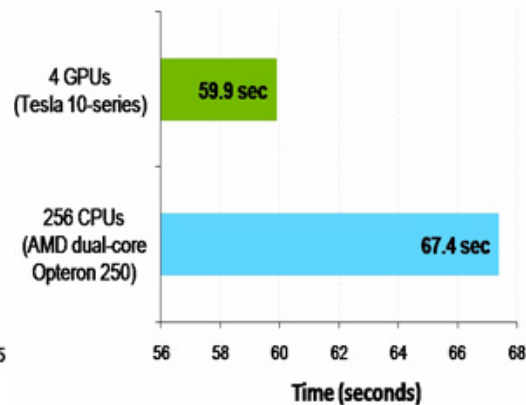


GeForce® GTX 980 Graphics card

Advanced MRI
Reconstruction Time



Computed Tomography (CT)
Reconstruction Time



Topic: Computing on GPUs

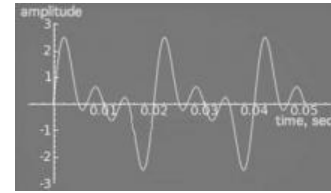
Task: High-performance image processing algorithms on graphics processing units (GPU).



cuBLAS
Linear Algebra



cuSolve
Direct Solvers



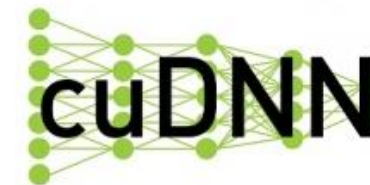
cuFFT
Fast Fourier Transform



NPP
Image Processing Primitives



OpenCV
Computer Vision



cuDNN
Neural Networks

GPU accelerated software in IPS and IPE:

- UFO framework
- Filtered-back projection
- Laminographic reconstruction
- Simulation of X-ray Data (SYRIS)

Current developments:

- Segmentation algorithms
- ART reconstruction to reduce dose
- 3D Optical flow methods

Lecture “Image Acquisition Methods and Image Analysis”

“Методы получения и анализа изображений”

Image Acquisition Methods and Image Analysis



- For Bachelor students of Institute of Cybernetics (IC)
- As the discipline on student's choice
- **Online** course from KIT (Germany) to TPU
- Language: Russian or English?

- Requirements:
 - Mathematics
 - Programming
 - No previous knowledge of algorithms or image processing is required!
- Practical exercises
- Final exam

Image Acquisition Methods

- Imaging with Visible Light
 - Electromagnetic Spectrum
 - Optics, Sensors
 - Photography
 - Telescopes, Microscopy
- 2D X-ray and Gamma-ray Imaging
- X-Ray Computed Tomography (CT)
 - Principles
 - Reconstruction: FBP, ART
 - Artifacts
 - Visualization
- Magnetic Resonance Imaging (MRI)
- Electron Microscopy
- Light-sheet Microscopy
- Ultrasound (US)

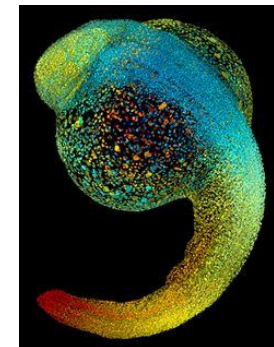
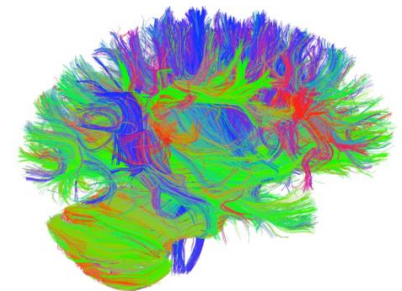
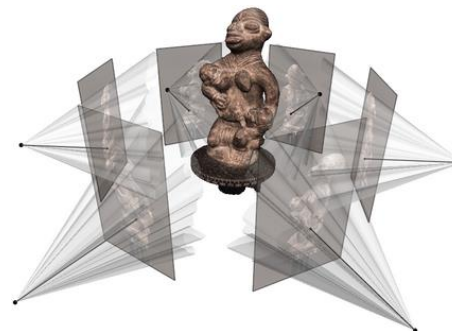
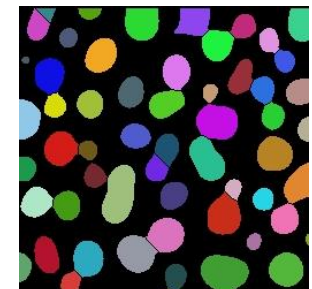
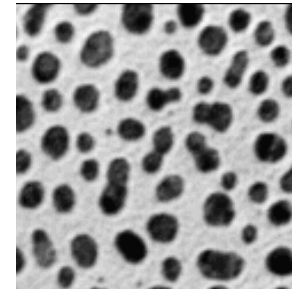
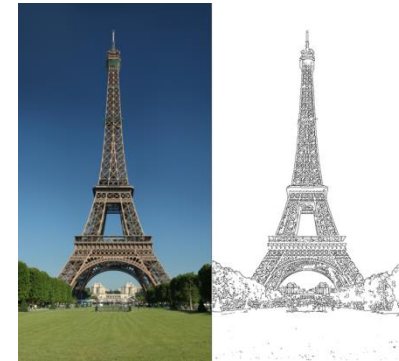


Image Processing and Computer Vision



- Foundations
- Image Transformations
 - Fourier Transform
 - Wavelet Transform
- Image Compression and Interpolation
- Linear Filters
- Non-linear Filters
- Morphological operations
- Image Segmentation
- Sequence Analysis
 - Optical Flow
 - Image registration
 - Object Tracking
- 3D Image Reconstruction
- Object Recognition



Acknowledgements – The Team

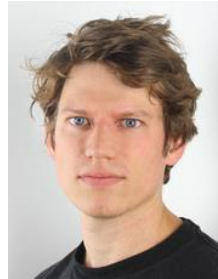


Tilo
Baumbach
Director ANKA
Research supervisor IPS



Ralf
Hofmann

Phase retrieval



Julian
Moosmann
X-ray Imaging



Tomy
dos Santos
Rolo

Fast tomography



Jubin
Kashef
Developmental
biology



Thomas
van de Kamp
Zoology
(arthropods)

Summary

If you are interested in:

- Work on topics of Bachelor/Master thesis (**will be available soon**)
- Make an internships / student practice in KIT, Karlsruhe, Germany
- Participate in lecture: “Image Acquisition Methods and Image Analysis”.
- Scientific collaboration with our group

Lecture will be organized **only** if there will be interest from students!

Take a short poll and give your feedback!

<http://simpoll.ru/run/survey/39a97383>



Thank you for your attention!

Questions?