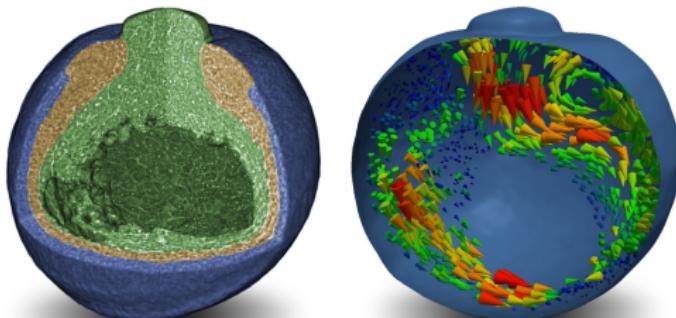




# In vivo imaging using X-ray phase-contrast microtomography

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August 17, 2015, Philips Hamburg



# Outline

Introduction & Motivation

Experimental setup & principles of propagation-based phase contrast

Phase retrieval

In vivo imaging

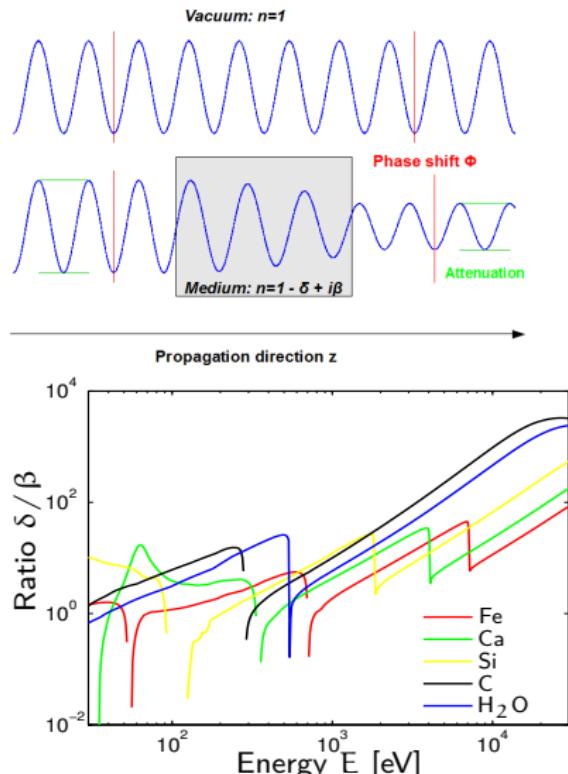
# Introduction

- ▶ Hard X-rays are strongly penetrating electromagnetic waves
- ▶ Interaction of X-ray and matter described by refractive index

$$n = 1 - \delta + i\beta$$

- ▶ Absorption:  $\sqrt{I_0} = \frac{2\pi}{\lambda} \int dz \beta(z)$   
Phase:  $\phi_0 = \frac{2\pi}{\lambda} \int dz \delta(z)$
- ▶ Use monochromatic coherent X-ray with energies s.t.

$$\delta/\beta \gg 1$$



→ Imaging of weakly absorbing materials using phase-contrast

# Motivation

- ▶ Biological specimen w/o cartilage, bone, & blood vessels are essentially pure-phase objects for  $E > 20 \text{ keV}$
- ▶ Imaging techniques to study the development of model organisms are essential tools in Biology, Medicine, Toxicology,  
....
- ▶ Examples of important vertebrate model organisms



Xenopus laevis



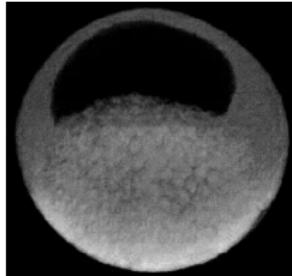
zebrafish



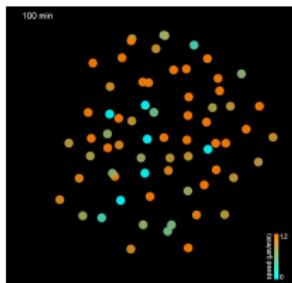
lamprey

# Comparison: 4D imaging techniques

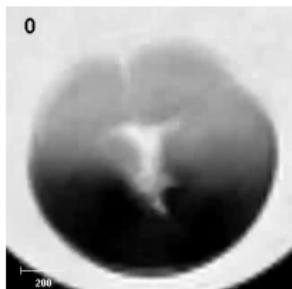
- ▶ Optical microscopy
  - ▶ Non-destructive: Surfaces / thin samples
  - ▶ Destructive: Sectioning
- ▶ Fluorescence microscopy
  - ▶ Expression of fluorescence marker
  - ▶ Photobleaching
  - ▶ Sparse information
  - ▶ Limited depth information: few cell layers
- ▶ Magnetic Resonance Imaging
  - ▶ Non-destructive
  - ▶ Dense & deep information
  - ▶ Limited spatial & temporal resolution



Xenopus:  
optical,  
sectioned



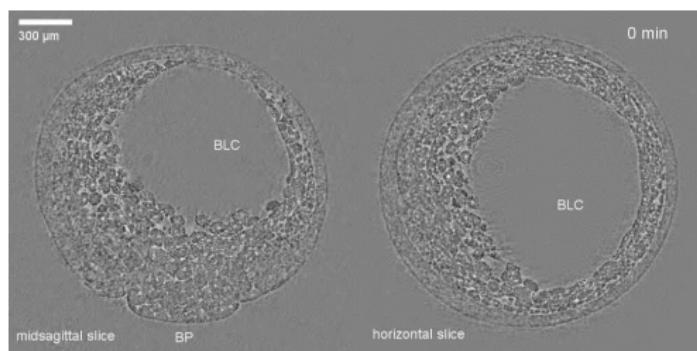
Zebrafish:  
light-sheet  
microscopy



Xenopus:  
MRI

# Comparison: 4D imaging techniques

- ▶ X-ray phase-contrast tomography
  - ▶ Fast
  - ▶ Dense 3D information
  - ▶ Apt for optically opaque objects
  - ▶ Possible time lapse  $\lesssim 2\text{ h}$



Xenopus gastrulation:  
2-BM@APS  
energy  $E = 30\text{ keV}$ ,  
object-detector dist.  $z=62\text{ cm}$   
pixel size  $\Delta x=1\text{ }\mu\text{m}$   
bandwidth  $\Delta E/E=10^{-2}$   
exposure time/image  $\Delta t=15\text{ ms}$   
time lapse  $\sim 2\text{ h}$

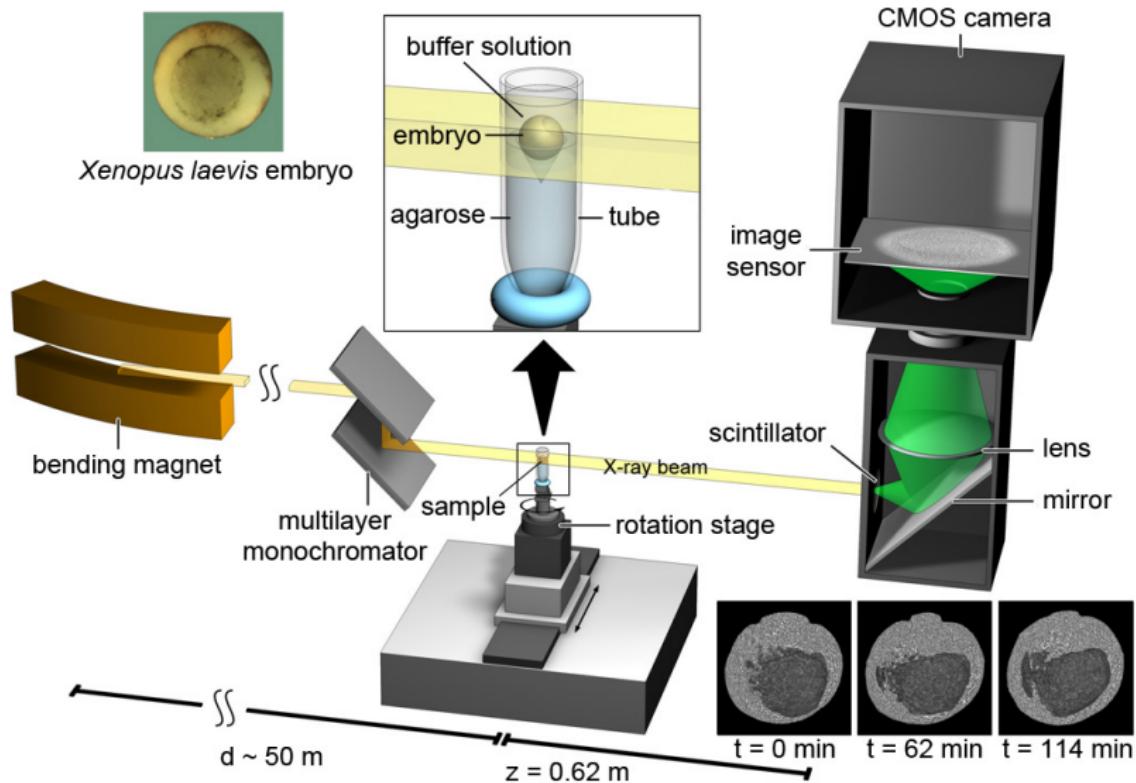
[Moosmann et al., Nature; Moosmann et al., Nature Protocols; Nawy, Nature Methods (research highlight)]

## Digital study

Using dense & deep 3D information allows to digitally study

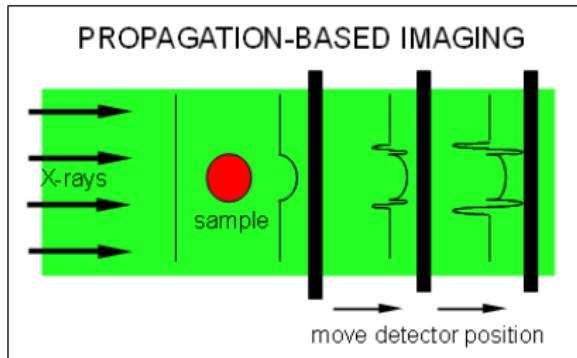
- ▶ Structural changes, gene expression, perturbation experiments: signal transduction and functioning of gene regulatory networks
- ▶ Cell and tissue dynamics: exchange of fluids and nutrients, deeply buried transient structures, cell migratory behaviour, ...
- ▶ Propulsion mechanisms for cell and tissue migration: differential flow-field analysis (convergent extension, cell-cell adhesion, cell-matrix interaction, ...)

# Experimental setup

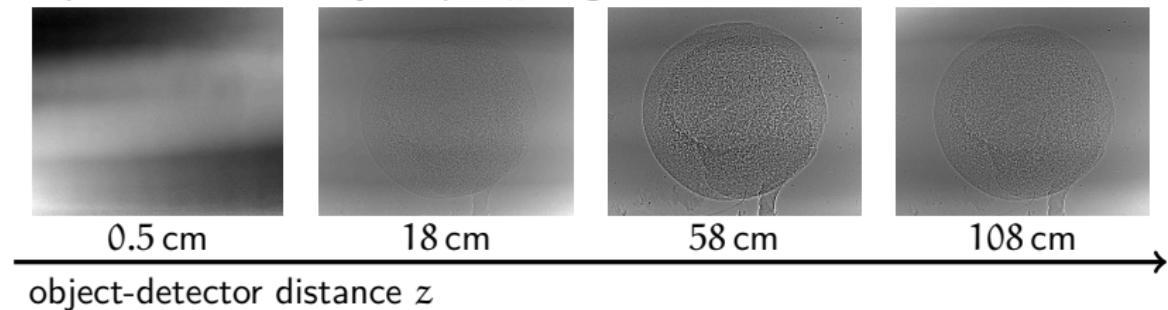


# Propagation-based phase contrast

- ▶ Simple setup: no additional optics, no scanning, no stepping → stable, fast, efficient
- ▶ Intensity contrast emerges via free-space propagation of transmitted wave field



Sequence of intensity maps  $I_z$ : signal increases



## Phase contrast

- ▶ Rewrite Fresnel diffraction integral [Guigay 1977]

$$\mathcal{F}I_z(\xi) = \int d\mathbf{x} \exp(-i2\pi\mathbf{x} \cdot \xi) \Psi_0(\mathbf{x} - \frac{\lambda z}{2}\xi) \Psi_0^*(\mathbf{x} + \frac{\lambda z}{2}\xi)$$
$$\mathbf{x}, \xi \in \mathbb{R}^2$$

- ▶ Intensity contrast  $g_z = I_z/I_0 - 1$
- ▶ Expand exponential of exit wave field  $\Psi_0 = \sqrt{I_0} \exp(i\phi_0)$
- ▶ Guigay up to  $\mathcal{O}(\phi_0)$  (pure-phase object)

$$\begin{aligned}\mathcal{F}g_z(\xi) &= 2 \sin(\pi\lambda z \xi^2) \mathcal{F}\phi_0(\xi) \\ &\quad - \cos(\pi\lambda z \xi^2) \int d\xi' \mathcal{F}\phi_0(\xi') \mathcal{F}\phi_0(\xi - \xi') \\ &\quad + \exp(i\pi\lambda z \xi^2) \int d\xi' \exp(-i2\pi\lambda z \xi \cdot \xi') \mathcal{F}\phi_0(\xi') \mathcal{F}\phi_0(\xi - \xi')\end{aligned}$$

# Phase retrieval

## Linear models

- ▶ Contrast transfer function (CTF)
  - ▶ Small relative phase variations:  
$$\left| \phi_0(x + \frac{\lambda z}{2} \xi) - \phi_0(x - \frac{\lambda z}{2} \xi) \right| \ll 1$$
  - ▶ High resolution

$$\mathcal{F}\phi_0(\xi) = \frac{\mathcal{F}g_z(\xi)}{2 \sin(\pi \lambda z \xi^2)}$$

[Guigay 1977; Gureyev et al. 2006; Cloetens 1998]

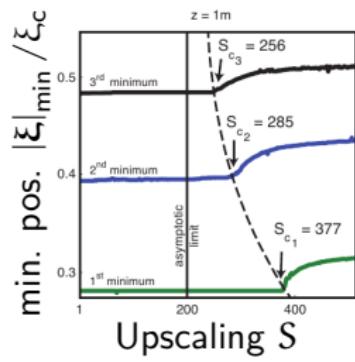
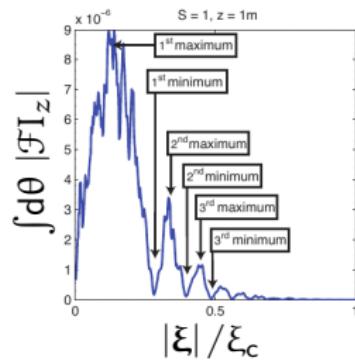
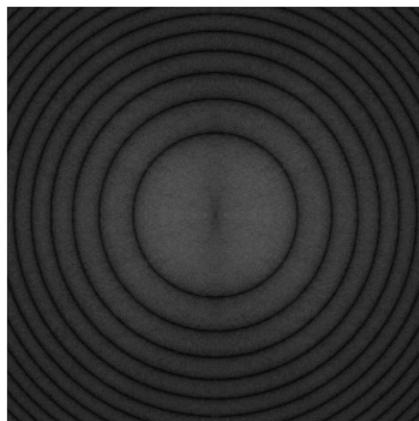
- ▶ Paganin phase retrieval
  - ▶ Edge-enhancement regime:  
small propagation distance
  - ▶ Low-pass filter
  - ▶ Robust

$$\mathcal{F}\phi_0(\xi) = \frac{\mathcal{F}g_z(\xi)}{2\pi\lambda z\xi^2}$$

[Teague 1982; Paganin & Nugent 1998; Bronnikov 2003]

# Evolution of contrast transfer

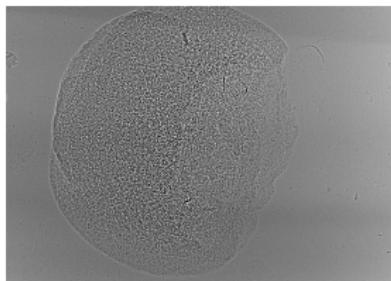
- ▶ Compute intensity contrast from input phase map (Lena test pattern)
- ▶ Amplify phase variations by upscaling of input phase
- ▶ Consider Fourier transformed intensity (contrast transfer) as a function of distance



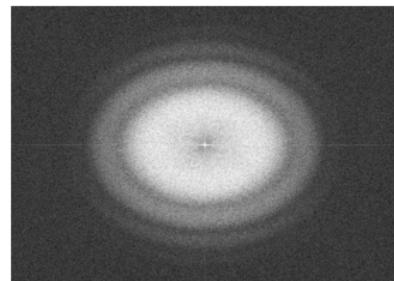
$$|\mathcal{F}I_z|(\xi)$$

# Phase retrieval: quasiparticle approach

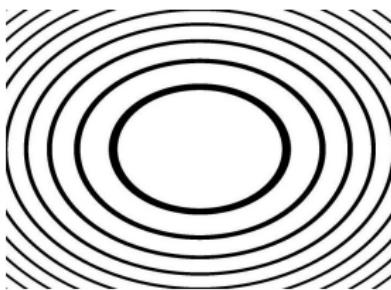
- ▶ Fourier space filter: crop regions around minima
- ▶ Phase retrieval via CTF using filtered intensity



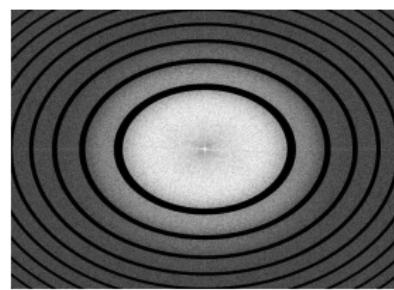
$I_z$



$|\mathcal{F}I_z|$



binary filter

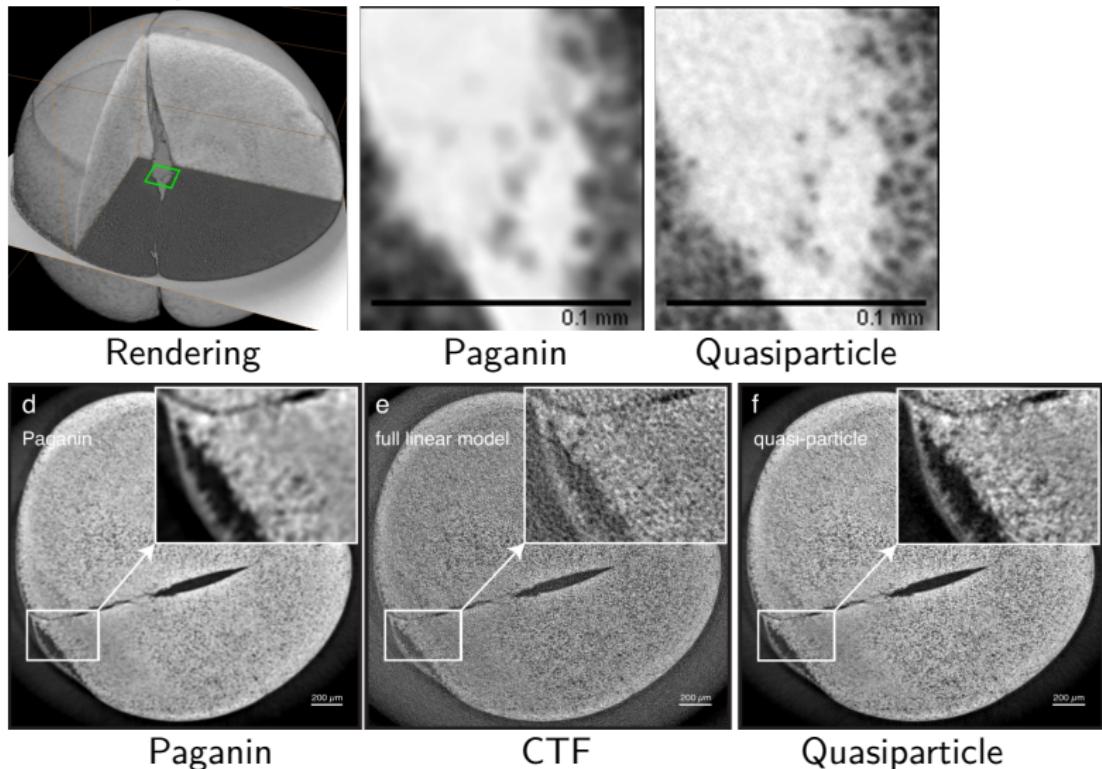


filtered  $|\mathcal{F}I_z|$

Data: TopoTomo@ANKA

# Tomography: Paganin vs CTF vs QP

Xenopus, 4-cell stage, ID19@ESRF,  $E = 20 \text{ keV}$ ,  $\Delta E/E = 10^{-4}$ ,  $z = 1 \text{ m}$ ,  
 $\Delta x = 0.75 \mu\text{m}$



## In vivo imaging: Considerations

- ▶ Motion blurring due to cell movement:  $\sim 4 \mu\text{m}$ 
  - ▶ Acquisition time for tomogram at resolution:  $\lesssim 30 \text{ s}$
  - ▶ Required flux density:  $> 10^{12} \text{ photons/s/mm}^2$
- ▶ Dose effects: heat load, double-strand breaking, radiolysis of water  $\rightarrow$  free radicals
- ▶ Setup optimisation
  - ▶ Energy: dose vs photon flux vs phase contrast vs detection efficiency
  - ▶ Exposure time: dose vs signal-to-noise vs motion blurring
  - ▶ Object-detector distance: signal-to-noise vs blurring (finite source size, coherence, nonlinear propagation effects)
  - ▶ Tomography: number of projection, fast shutter influencing dose, resolution, rotation blurring, ...

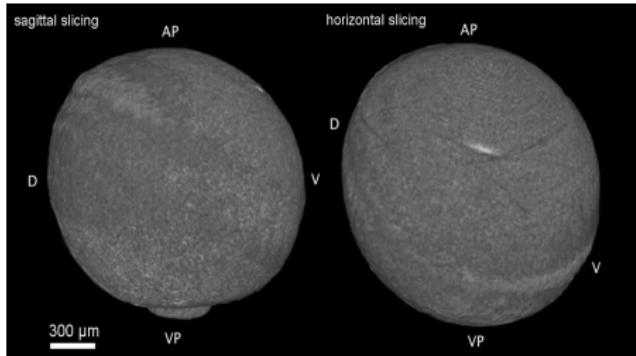
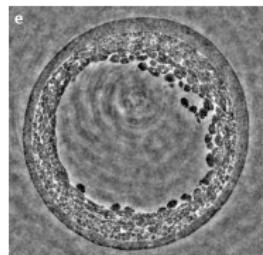
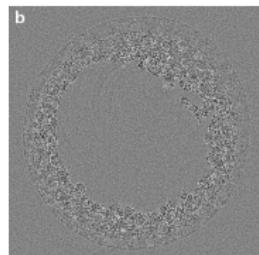
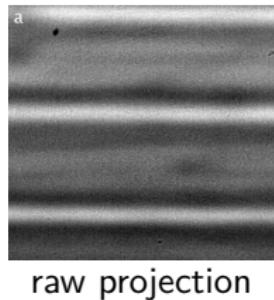
# 4D in vivo tomography

Xenopus gastrulation:

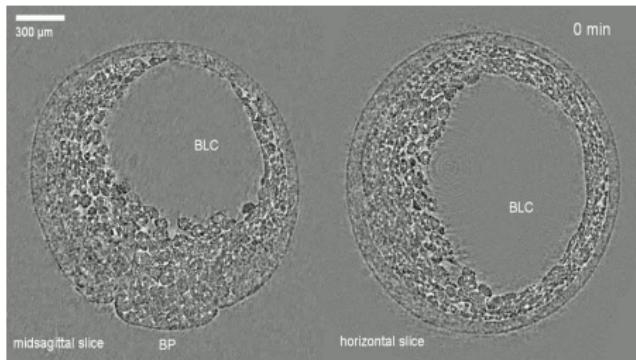
2-BM@APS, time lapse: 2 h,

time between tomograms:

10 min,  $\Delta x = 1 \mu\text{m}$ ,  $E = 30 \text{ keV}$ ,  
 $\Delta E/E = 10^{-2}$



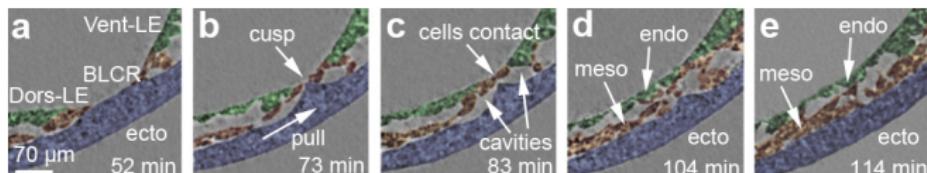
Slicing through rendered volume



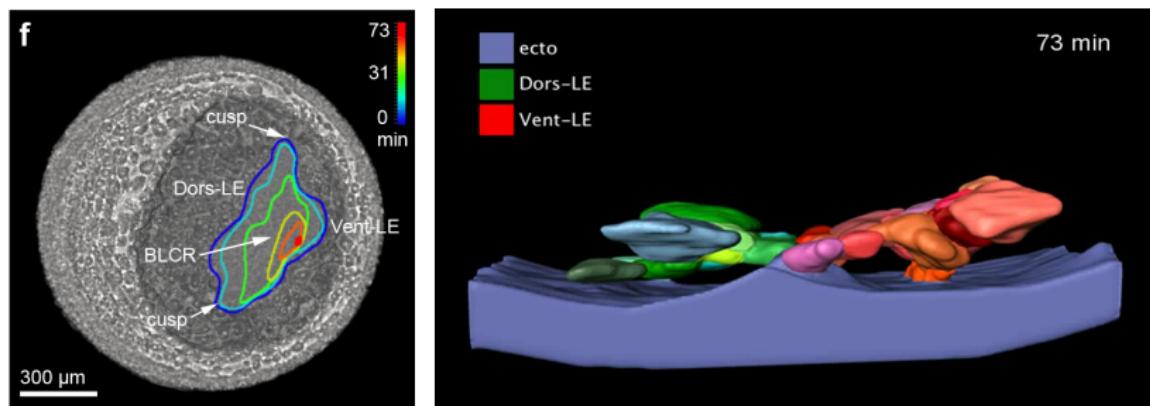
Time-lapse of reconstructed central slice

# New observation: transient structure

- ▶ Confrontation of head & ventral mesendoderm: formation of a transient ridge
- ▶ Not observable in fixed embryos or implants



Time lapse of reconstructed slice

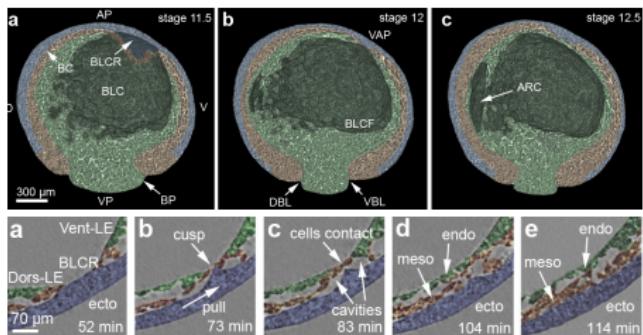


Moving contour of  
leading-edge mesendoderm

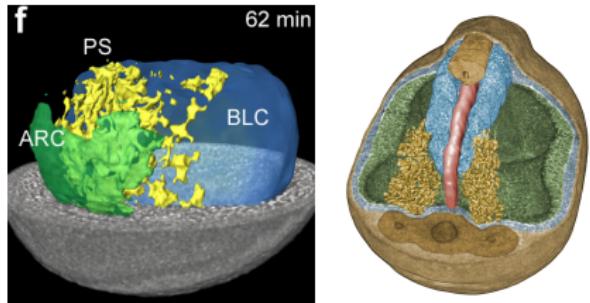
Segmented structures

# Data analysis

- ▶ Visual inspection



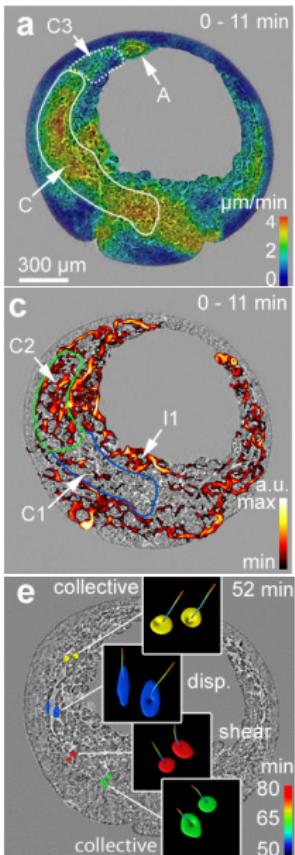
- ▶ Segmentation



- ▶ Optical flow: overall dynamics

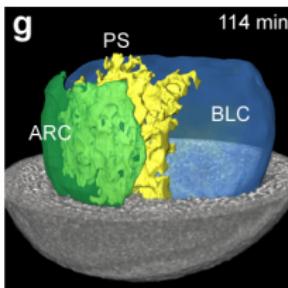
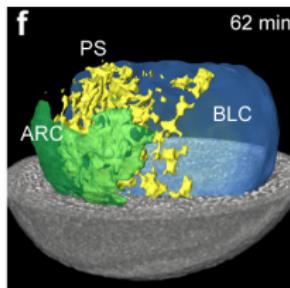
- ▶ Differential flow: collective vs individual movement

- ▶ Integrated flow: cell tracking

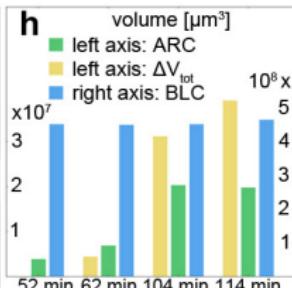


Thank you for your attention!

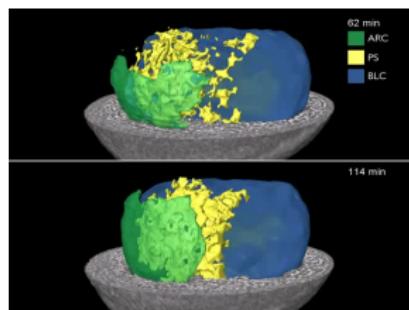
# Segmentation & volume analysis



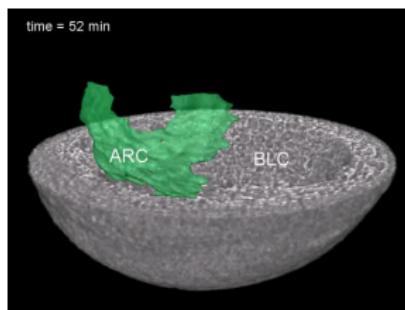
Archenteron inflation



Volume balancing



Segmented cavities



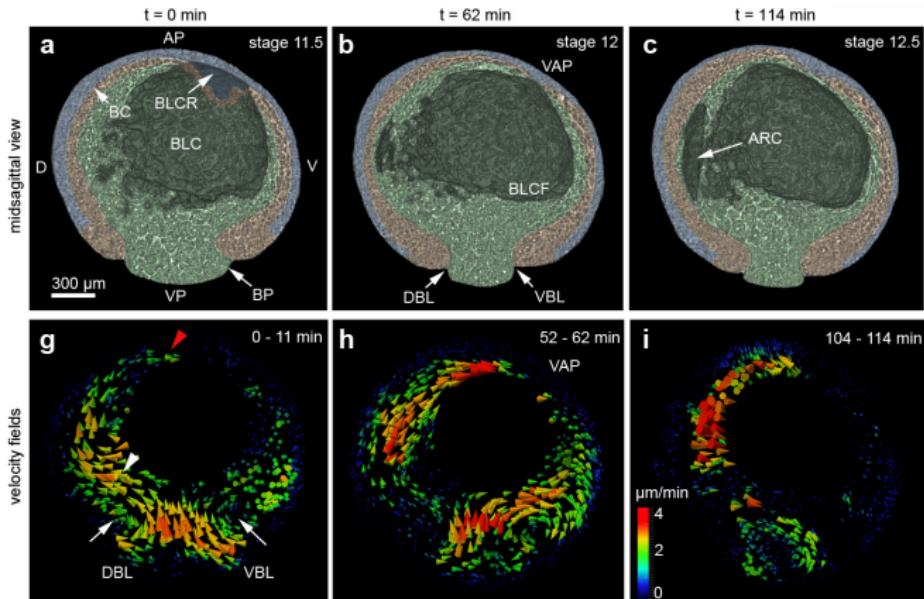
Inflating archenteron

- ▶ Conclusion: Archenteron inflation is driven by uptake of external water

# Optical flow

- ▶ Visualising overall dynamics

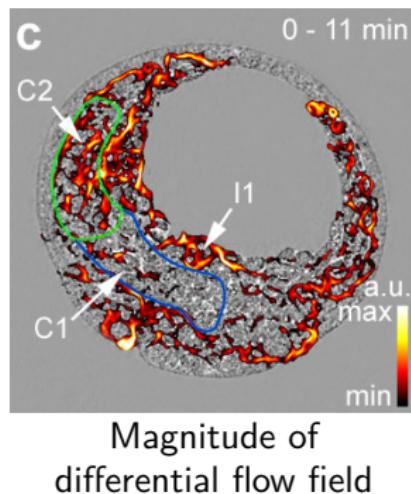
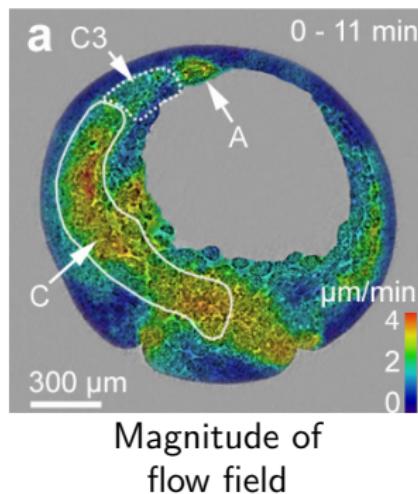
Rendering of halved embryo



Velocity field on central slab

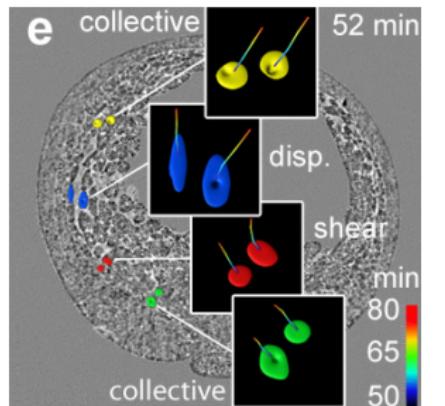
# Differential optical flow

- ▶ Collective vs individual movement
- ▶ Propulsion mechanisms



# Integrated optical flow

- ▶ Cell tracking via time integration



Trajectories of cell pairs

## Outlook

- ▶ 4th generation synchrotron upgrades implementing multi-bend achromat lattices: drastically enhanced coherence → enhanced contrast, allows larger z
- ▶ Cone-beam magnification using Kirkpatrick Baez mirrors, ...
- ▶ Optimising detector system: scintillator, microscope, camera, blurring, deconvolution, point spread function, ...
- ▶ Tomography: fast shutter, dose, noise, stepping vs on-the-fly, alternative reconstruction techniques: algebraic, iterative, neural networks, sparsity, dictionary learning, ...
- ▶ Combination of X-ray phase-contrast & confocal fluorescence microscopy
- ▶ Systematic dose studies: dose delay effects, use of radical scavengers, find phenomenological function describing dose expression effects, ...
- ▶ Upcoming experiments: emigration & delamination processes of neural crest cells as a model for on-set of cancer metastasis
- ▶ Perturbation experiments (wildtype vs morphant embryos): role of adhesion molecules, signalling pathways, transcription