

# Simulating Organogenesis in COMSOL

Computational advances and challenges.

Computational Biology Group (CoBi)

D-BSSE

ETH Zurich



# OVERVIEW

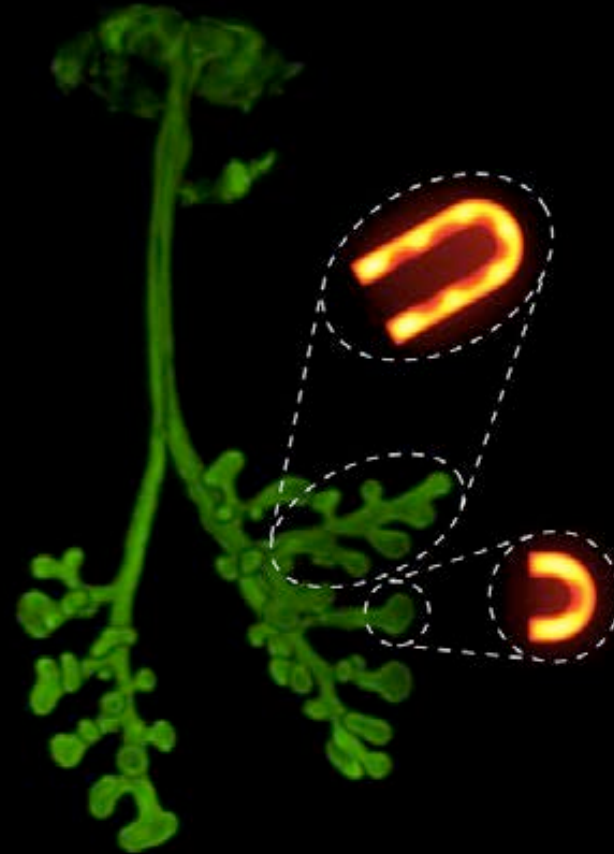
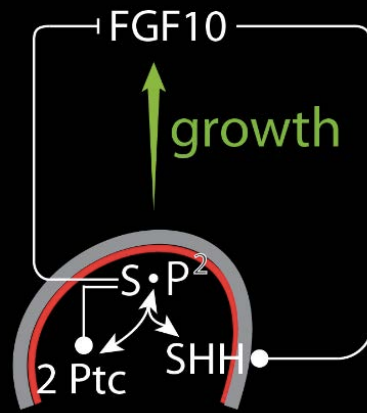
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- **Motivation:** Biological Questions
- **Example:** Modeling the Limb Bud
- **Results:** Optimizing this Model
- **Outlook:** Large Deformations

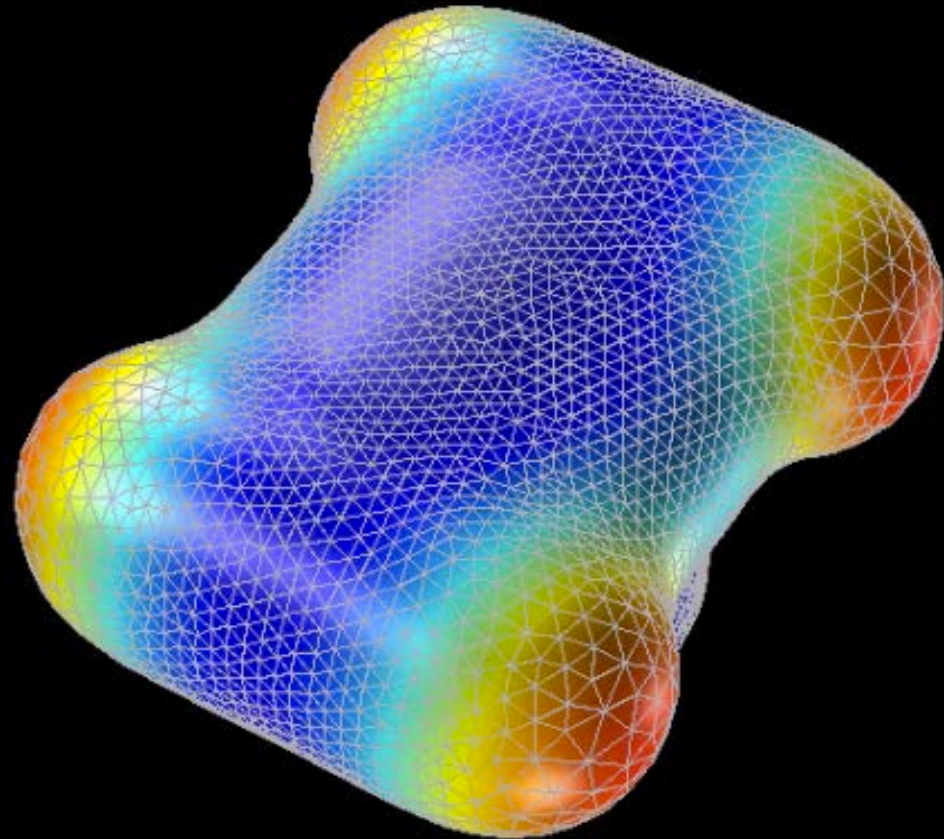
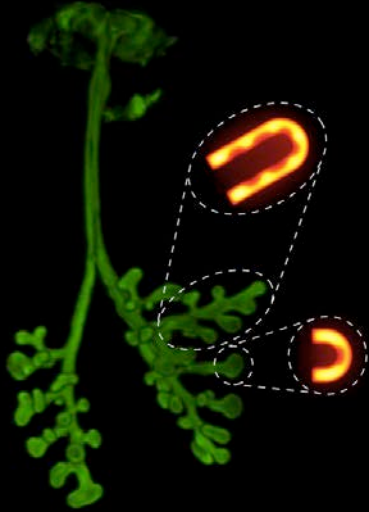
Biological Questions

# MOTIVATION

# LUNG BRANCH MODE SELECTION



# BRANCHING IN 3D



Modelling the Limb

# EXAMPLE

# REACTION DIFFUSION EQUATION

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- We use systems of reaction diffusion equations on a growing domain

$$\dot{X} + \vec{\nabla}(u \cdot X) = D_X \Delta X + R_X(X, Y, \dots)$$

$$\dot{Y} + \vec{\nabla}(u \cdot Y) = D_Y \Delta Y + R_Y(X, Y, \dots)$$

...

- Typically we have 3-15 of these equations, non linearly coupled via the reactions  $R_X$
- Speed  $u$  might be given (e.g. zero or constant) or a function of reactions (e.g. on the boundary proportional to the normal and some concentration)

# TYPICAL REACTIONS

- A simple reaction is decay

$$R_X = -\delta X$$

- Often we have complex formation

$$R_L = -\rho_{LR} \cdot L \cdot R$$

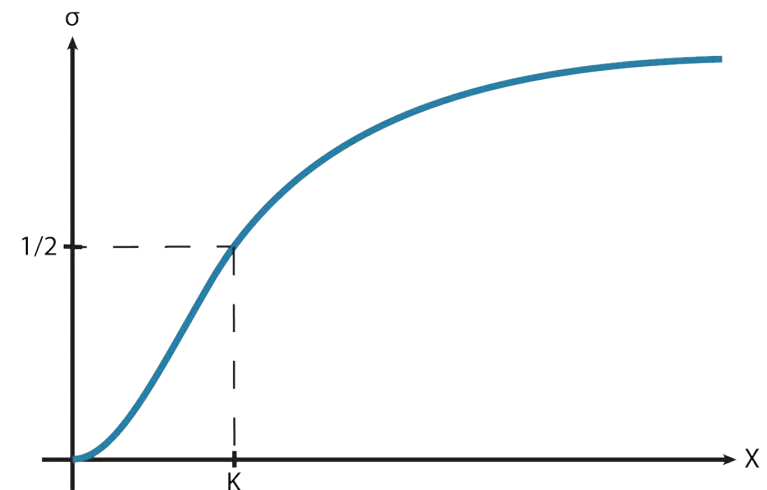
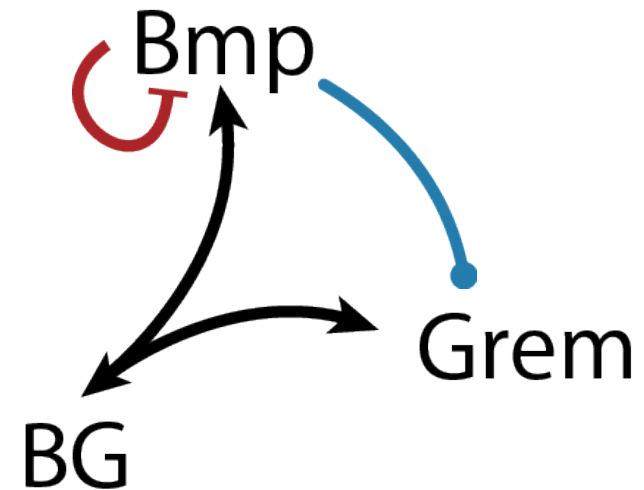
$$R_R = -\rho_{LR} \cdot L \cdot R$$

$$R_{LR} = \rho_{LR} \cdot L \cdot R$$

- Or activation and inhibition respectively

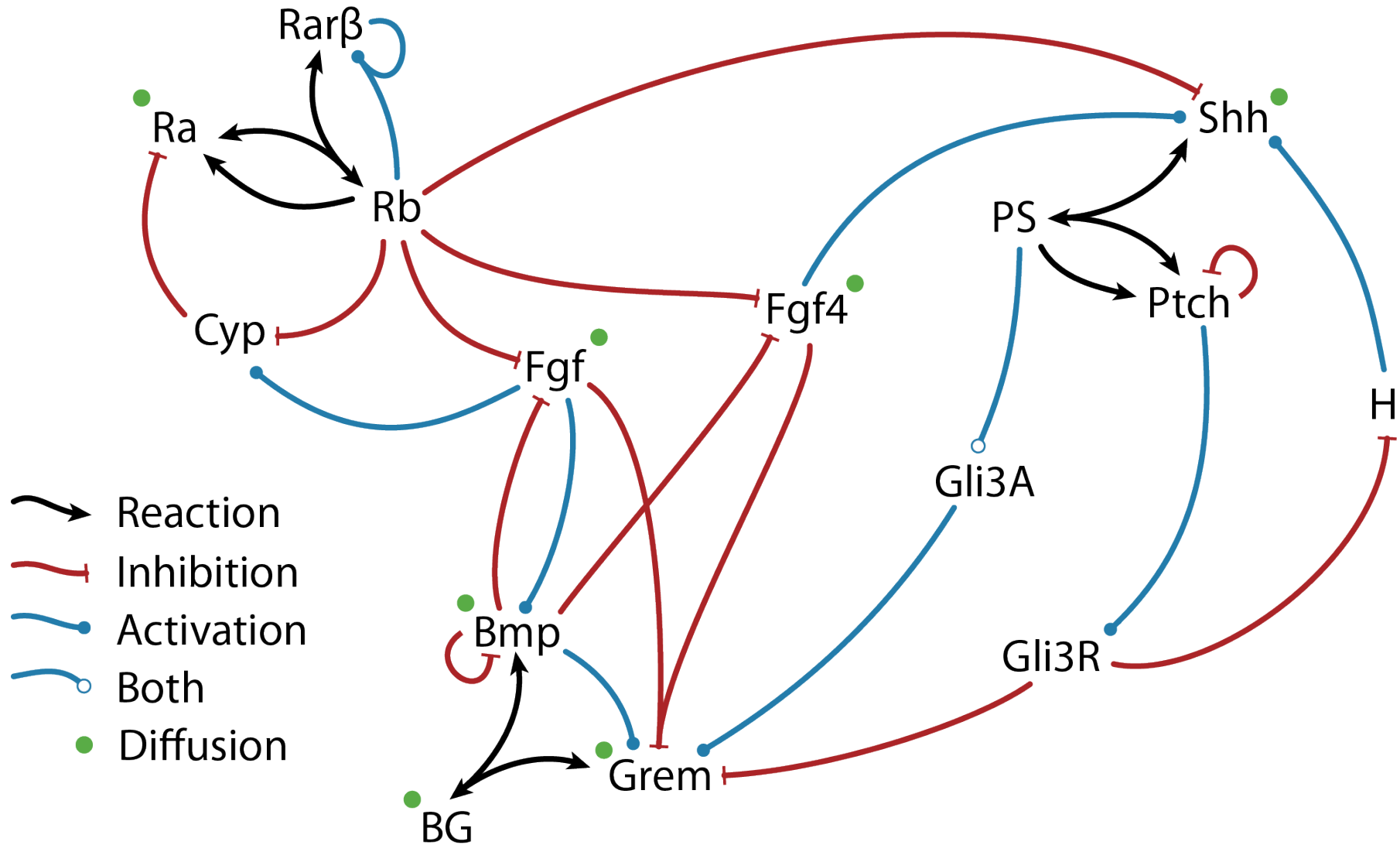
$$\sigma = \frac{X^n}{X^n + K^n}$$

$$\bar{\sigma} = \frac{K^n}{K^n + X^n}$$

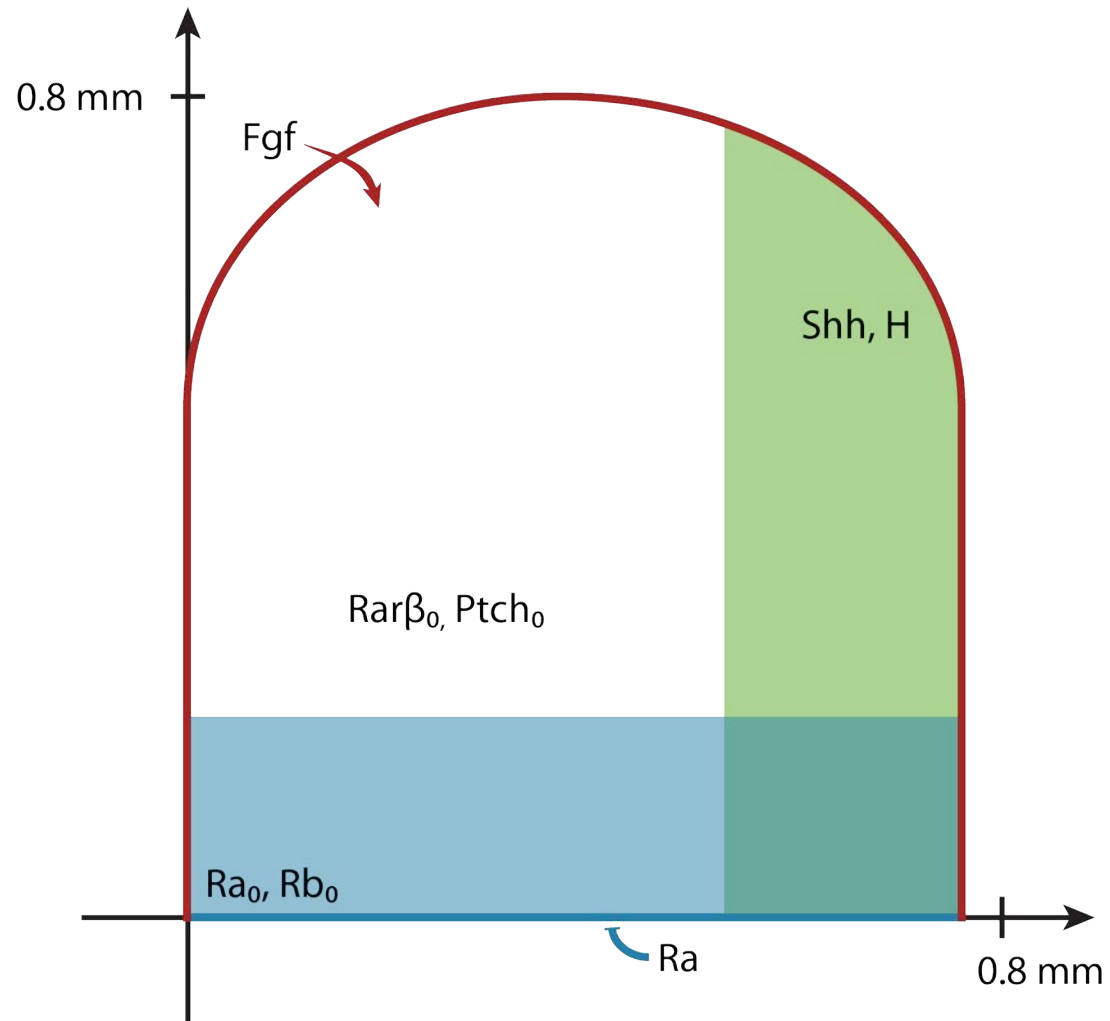




# SIGNALING NETWORK LIMB



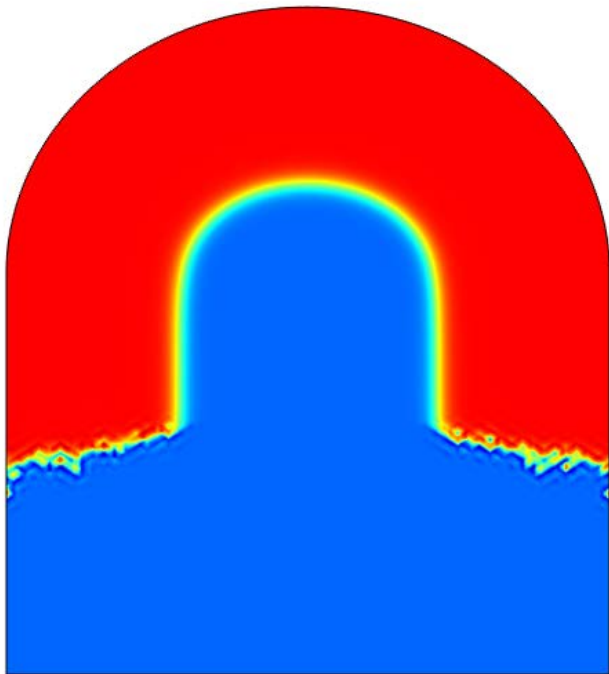
# THE GEOMETRY



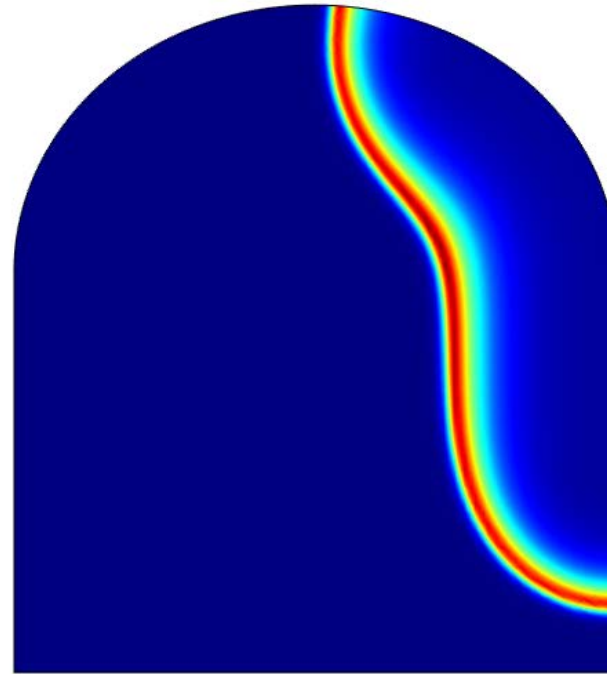
# GENERAL FEATURES

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Edges

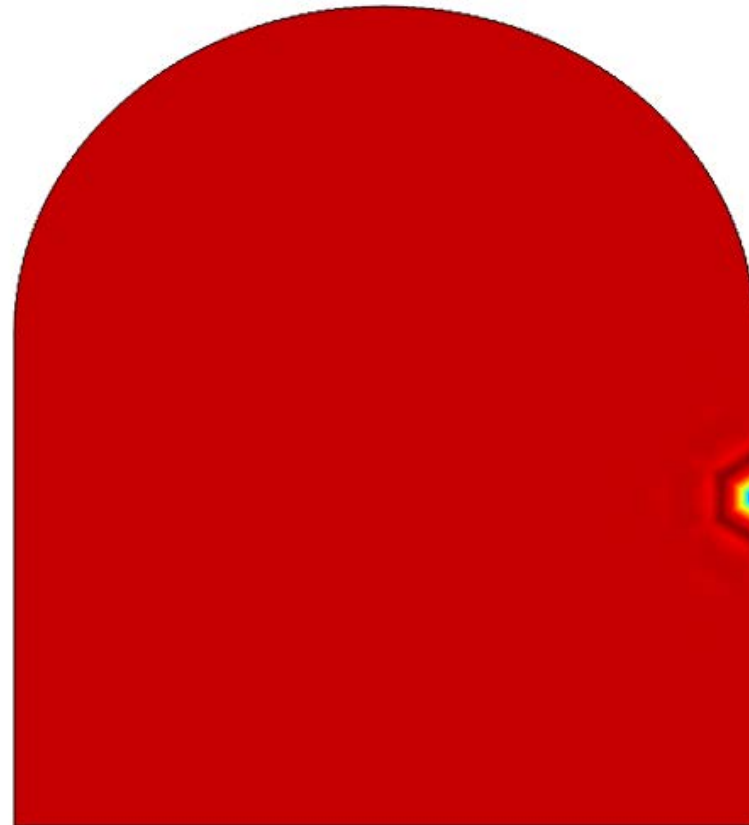


Traveling waves



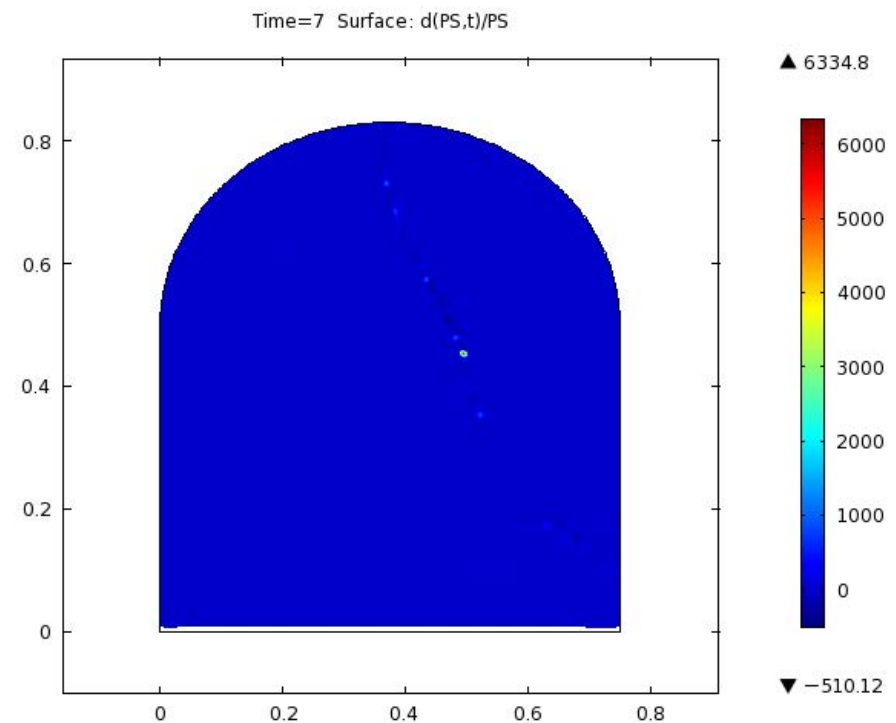
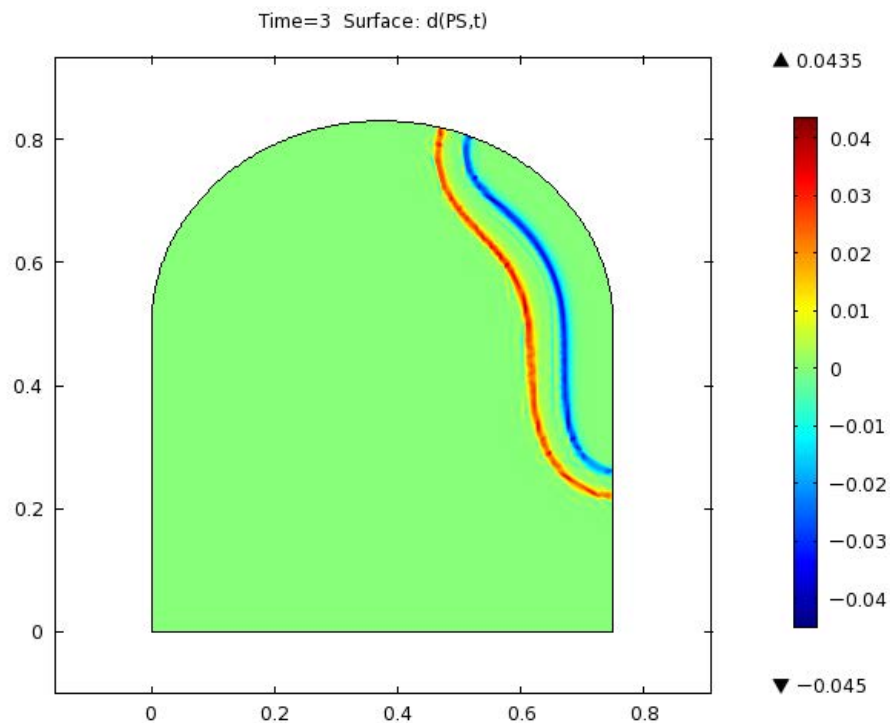
## Spikes

- Produced by complex dynamics
- Appearance all over the domain



# POTENTIAL TROUBLEMAKERS

- Three complexes on different time scales
- The involved diffusion constants range from 0.02 to 0.0002, some species do not diffuse at all
- Maximal species concentrations range from order 0.0001 up to order 100
- Stiffness?



Optimising the Limb Model

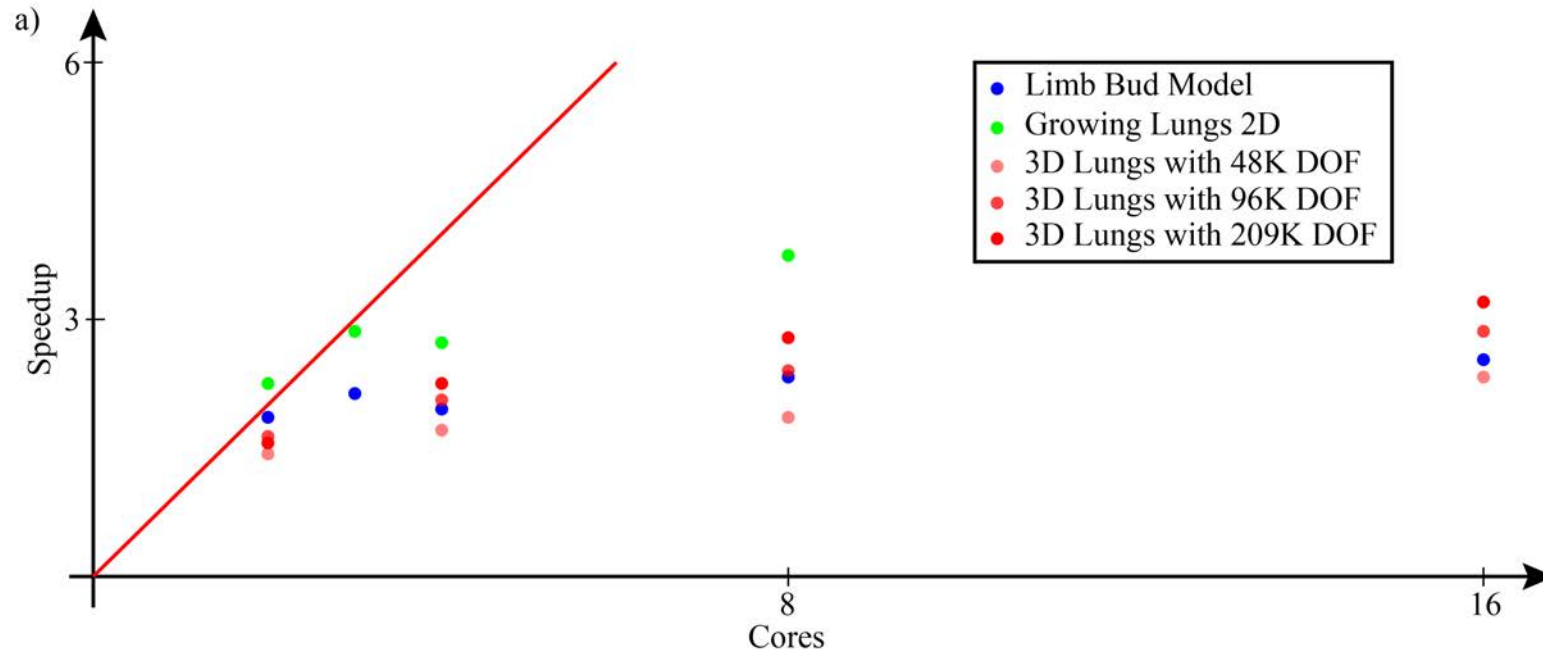
# RESULTS

# ADVANCES: OPTIMIZING MODELS

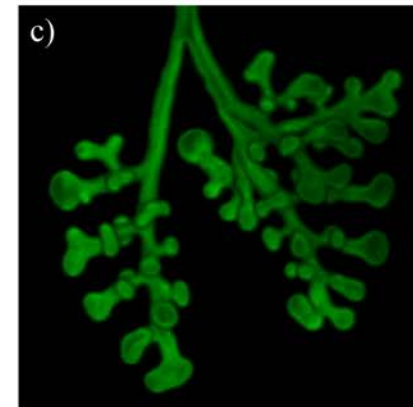
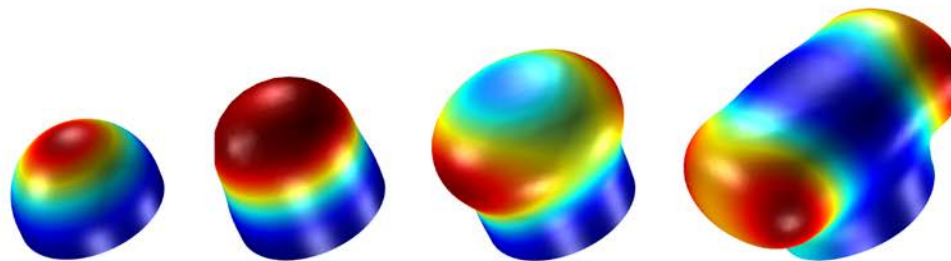
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- **36 h** using Sledgehammer method (smaller relative error, limited timesteps & Jacobian update at each iteration)
  - **Not acceptable for finding parameters and testing ideas efficiently**
- **9 h** removing discontinuities in production terms and initial conditions and relaxing solver settings
- **< 3 h** using cubic Lagrange elements (instead of quadratic) on a coarser grid
- **30 minutes** using manual scaling for the error estimation, allowing for quadratic elements on coarser grids
- **5 minutes** segregating the delicate complex formations from the rest
  - Keep ALE & 3D in mind!

# PARALLELIZATION



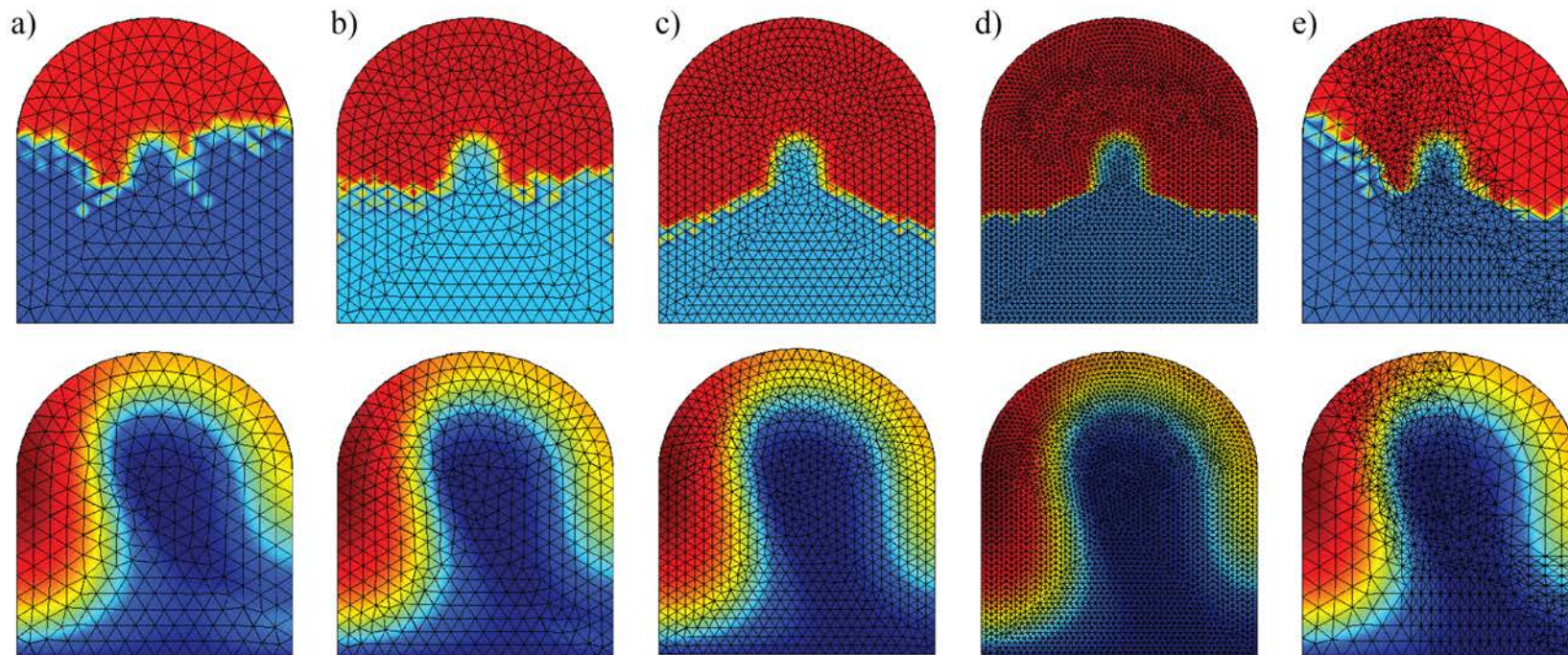
b)





# ADAPTIVE REMESHING

- Does not improve computing times
- Can produce artificial asymmetries

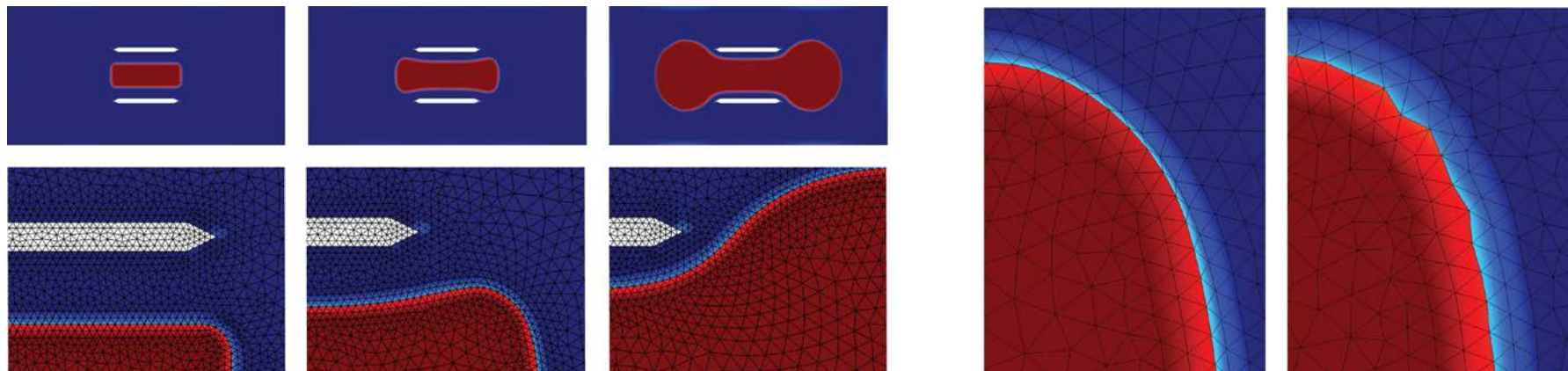


Large Deformations from Growth

# OUTLOOK

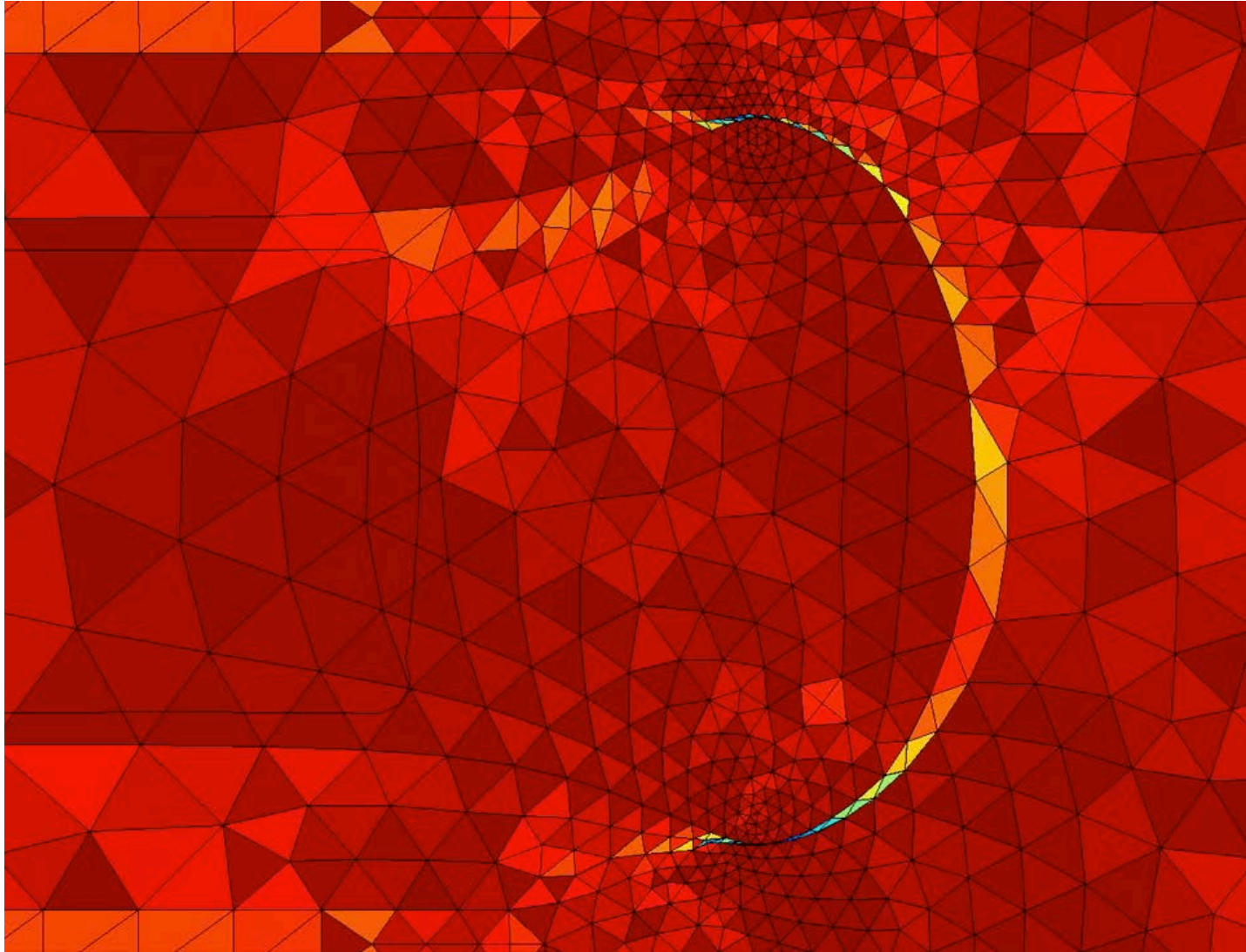
# CHALLENGES: IMPLEMENTING GROWTH

- Coupling to solid state or fluid mechanics equations
- Morphogens influence cell divisions and adhesion
- Similar strategies help avoid problems with automatic remeshing in COMSOL
- Linear shape order & Laplacian smoothing works in our experience best



# STABILITY ISSUES

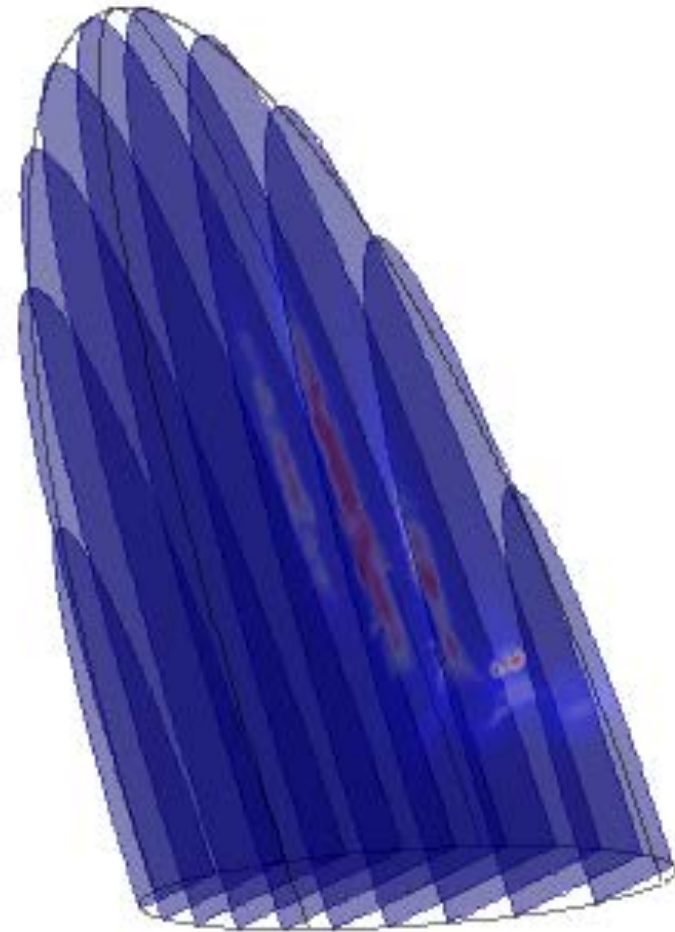
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# OUTLOOK

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- Going 3D
- Coupling continuum physics and genetics
- Implementing directed cell divisions (via external forces?)
- Using differential surface tension to model adhesion properties





Swiss Institute of  
Bioinformatics

# AKNOWLEDGEMENTS



Everything should be made as simple as possible, but no simpler.  
*Albert Einstein*

## Computational Biology Group (CoBi)

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## Organogenesis

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## Numerics

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SystemsX.ch  
The Swiss Initiative in Systems Biology



SWISS NATIONAL SCIENCE FOUNDATION