



UNIVERSITY OF
OXFORD

Mathematical
Institute

Polarity controlled patterning in mammary bilayers

Chaste workshop 2023



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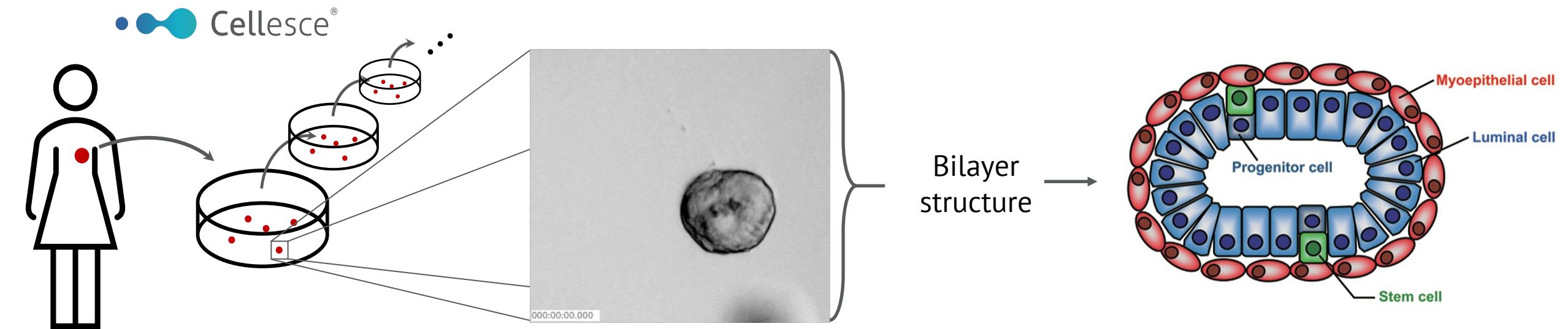
joshua.moore@maths.ox.ac.uk



CANCER
RESEARCH
UK

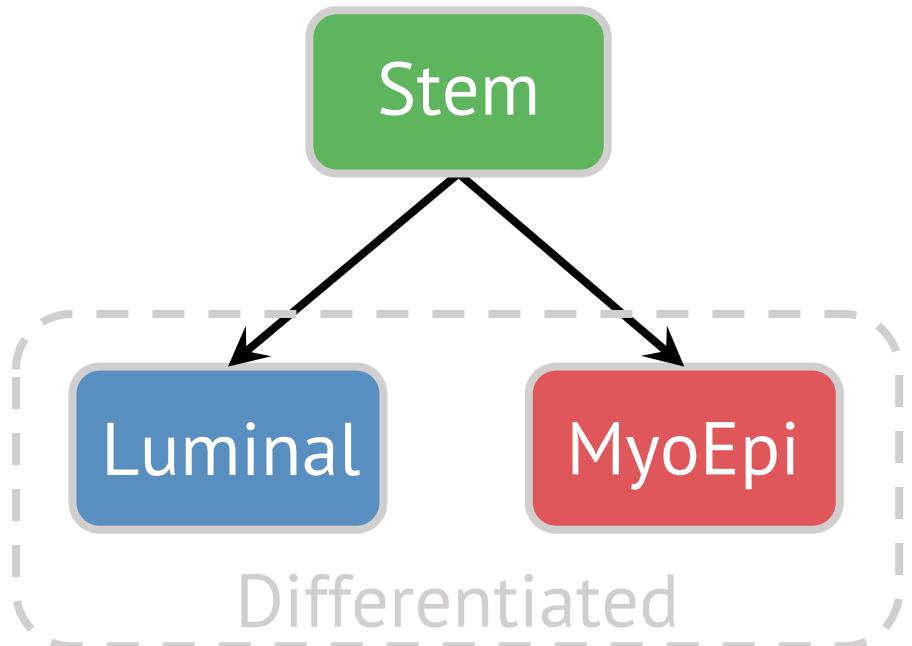


Plasticity in mammary organoids

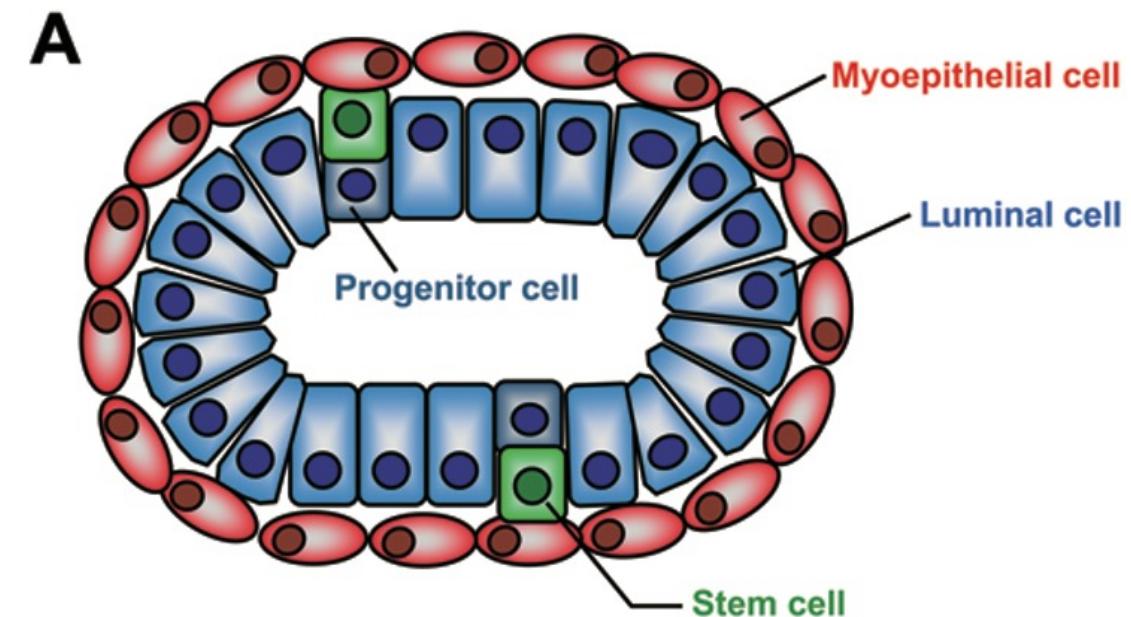


Plasticity in mammary organoids

Traditional hierarchy
in mammary tissue



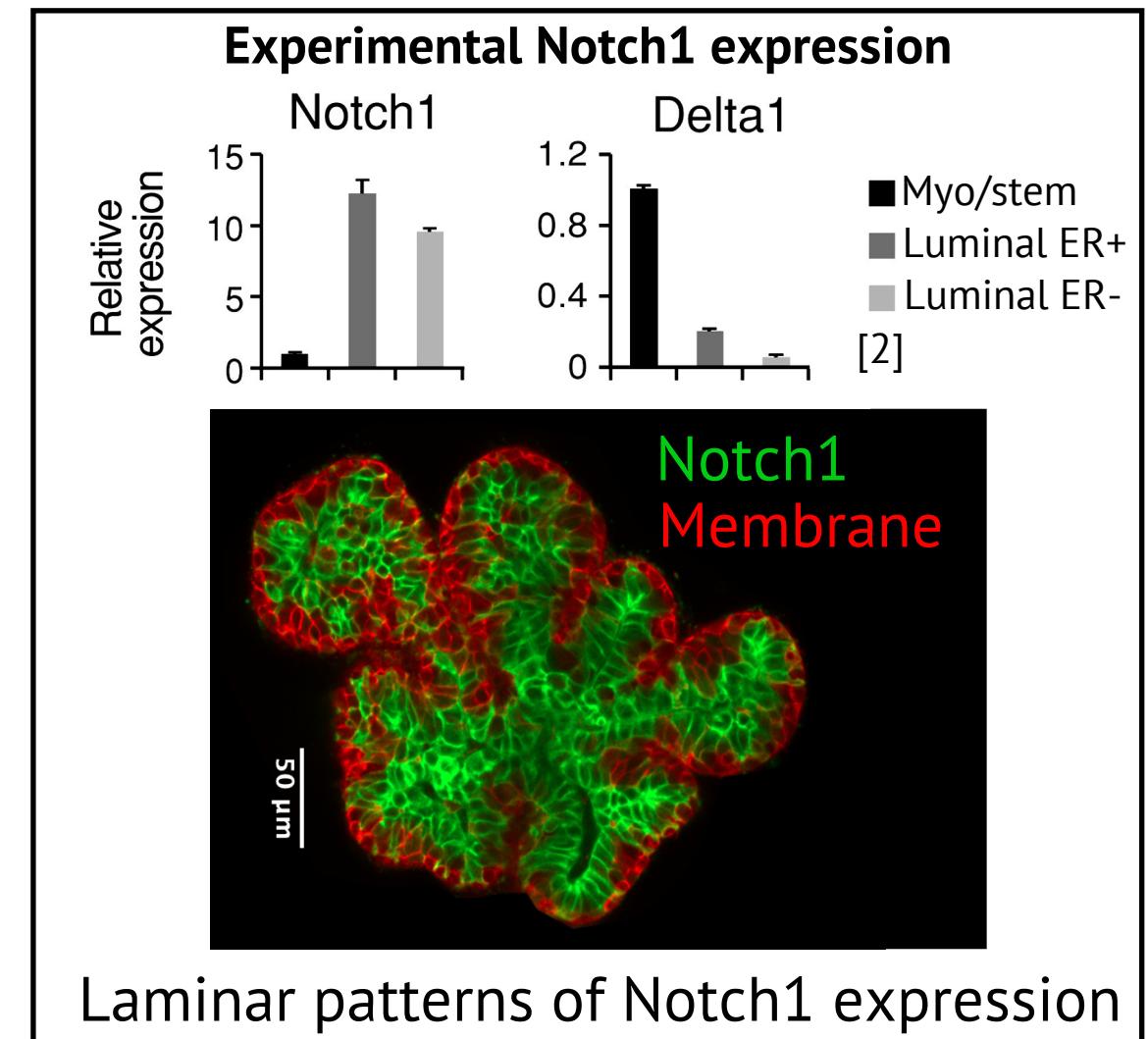
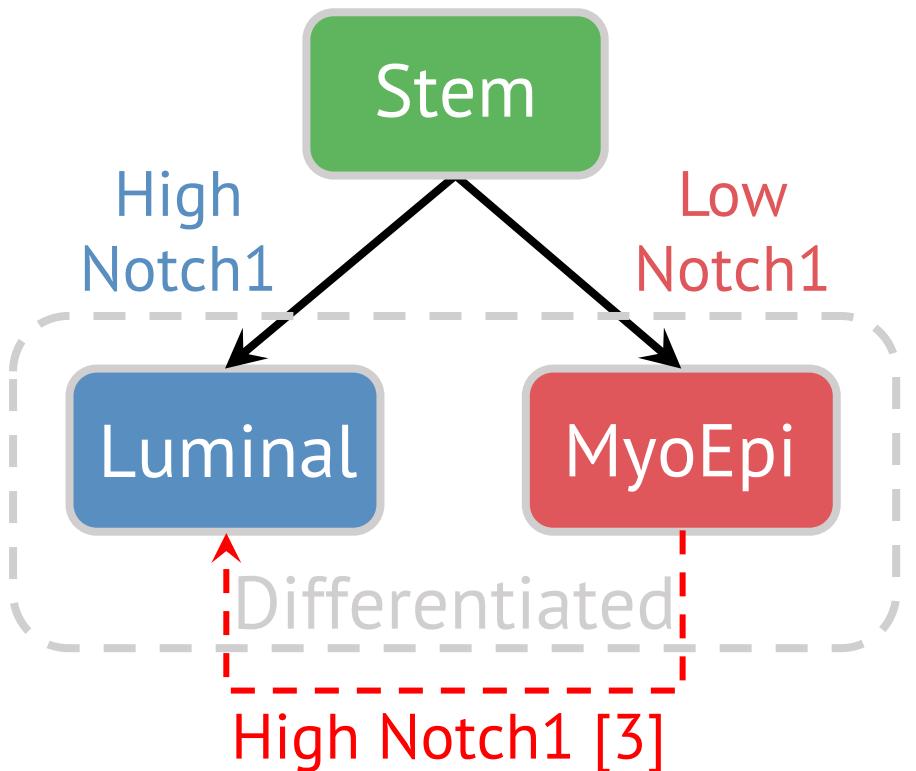
Observed hierarchy
in mammary organoids



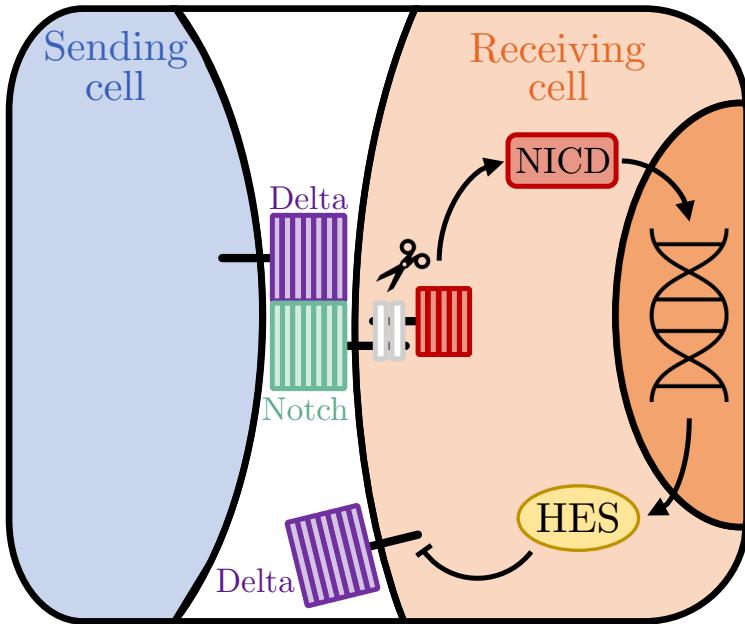
Organoid regeneration induces changes in cell identity

Mechanisms of cell-fate determination

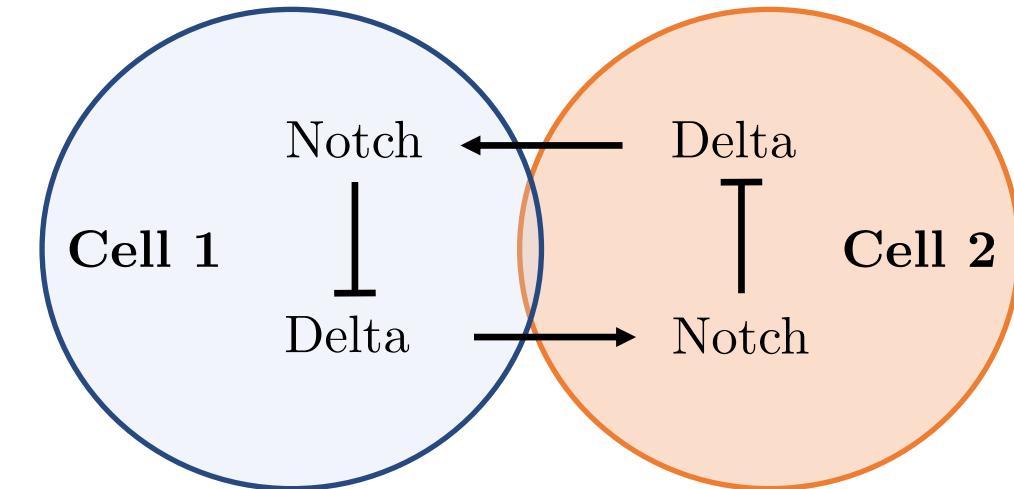
Notch1-dependent cell-fate decisions



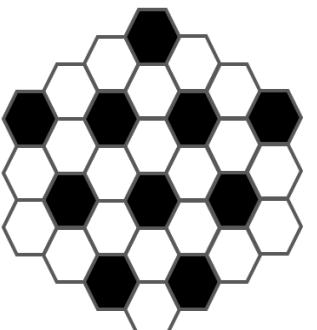
Notch patterning



A simple model of Notch signalling
Collier *et al.* (1996)



Autonomous Notch activity



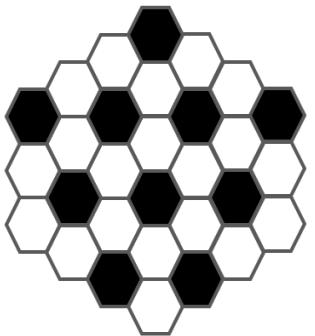
Sheet to bilayer



?



Notch patterning



Sheet to bilayer

Autonomous Notch activity



?

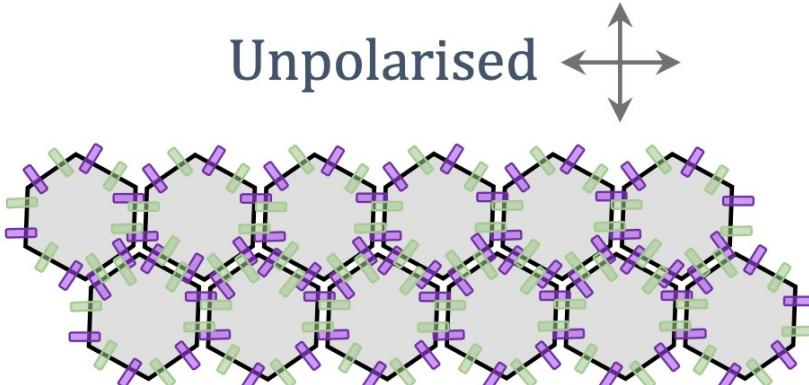


Possible mechanisms to promote laminar patterning:

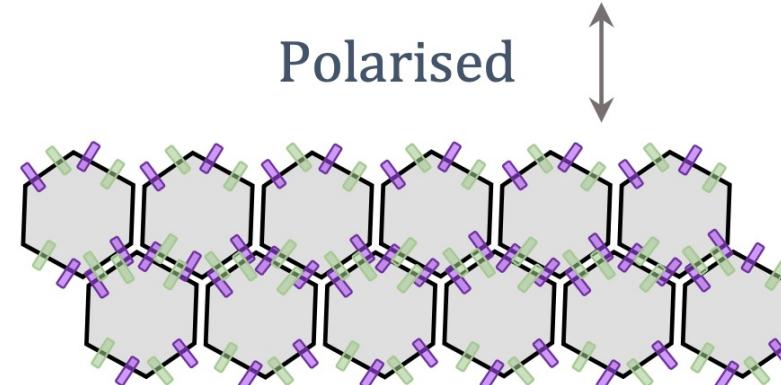
1

Cell signalling polarity

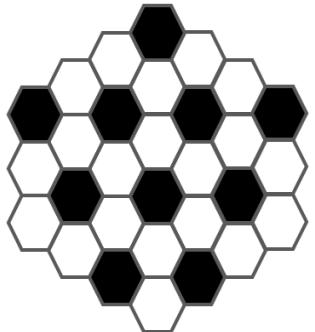
Unpolarised



Polarised



Notch patterning



Autonomous Notch activity

Sheet to bilayer



?



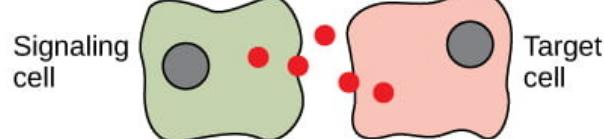
Possible mechanisms to promote laminar patterning:

2

Multiple signals (crosstalk)

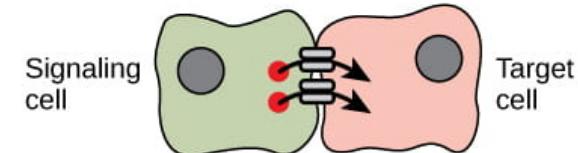
Paracrine

A cell targets a nearby cell.

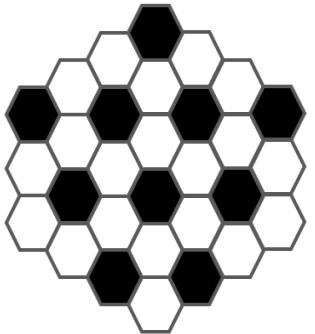


Signaling across gap junctions

A cell targets a cell connected by gap junctions.



Notch patterning



Autonomous Notch activity

Sheet to bilayer



?

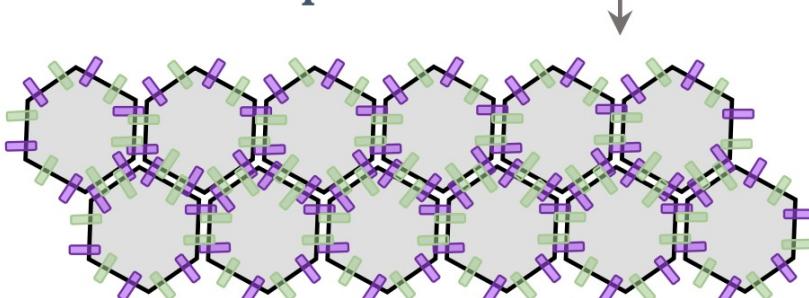


Possible mechanisms to promote laminar patterning:

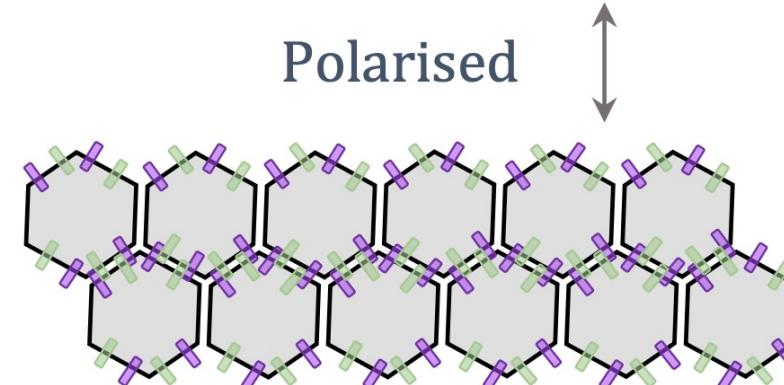
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Cell signalling polarity

Unpolarised

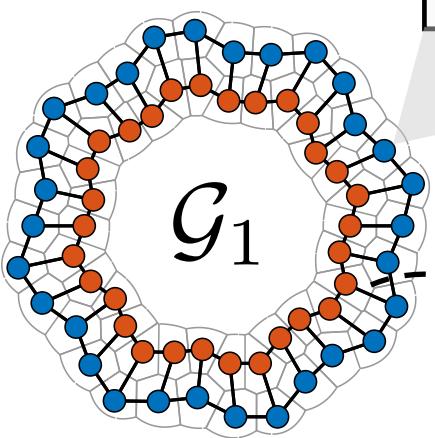
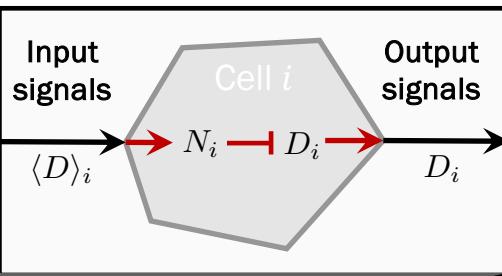


Polarised

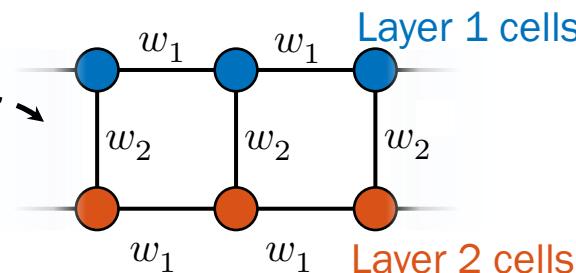


Combing tools for discrete pattern analysis

Network coupled ODEs (IO systems)



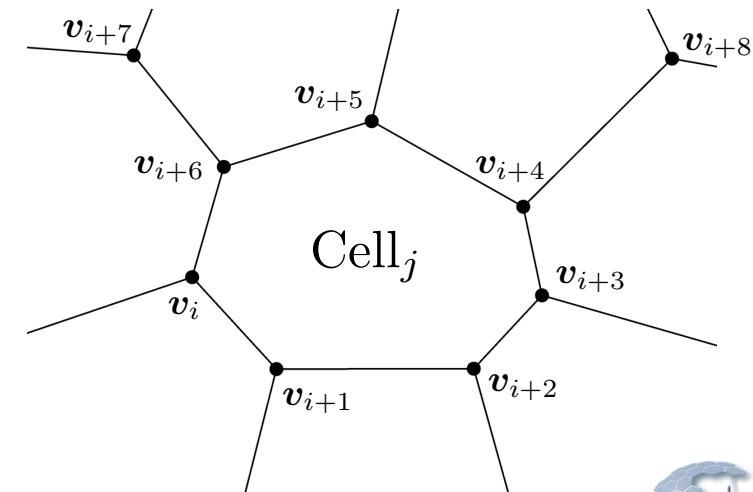
Spatially static



① Calibrating
polarity control

② Calibrating
network regimes

Cell-based modelling

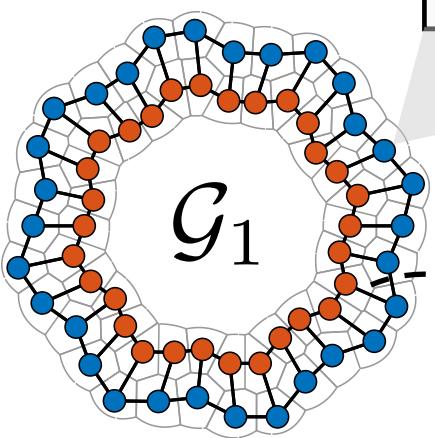
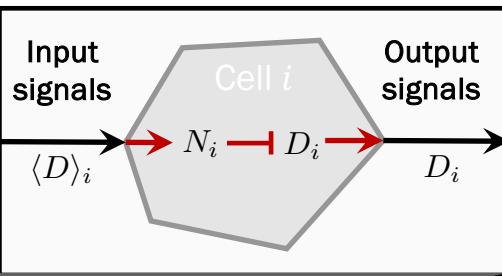


Spatially dynamic

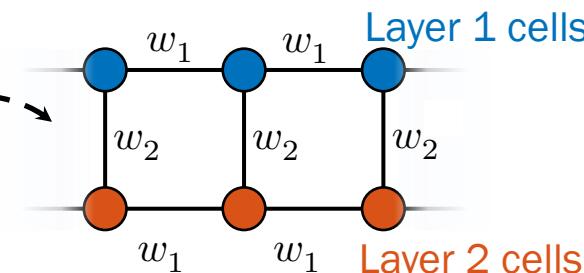


Combing tools for discrete pattern analysis

Network coupled ODEs (IO systems)



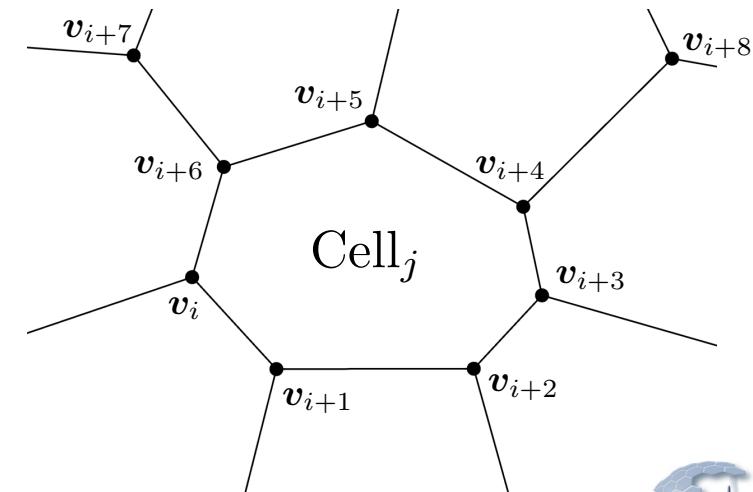
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Cell-based modelling

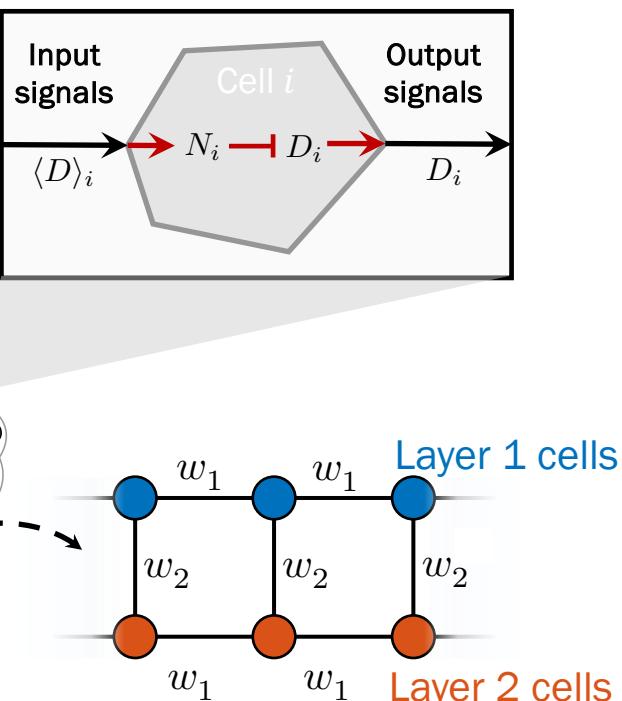


Spatially dynamic



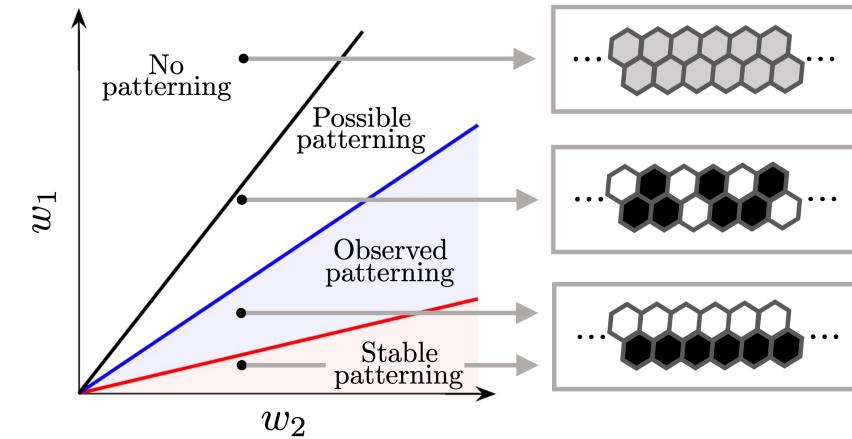
Calibrating polarity control

Network coupled ODEs (IO systems)



Network quotienting
+
Monotone ODE
theory
+
Control theory

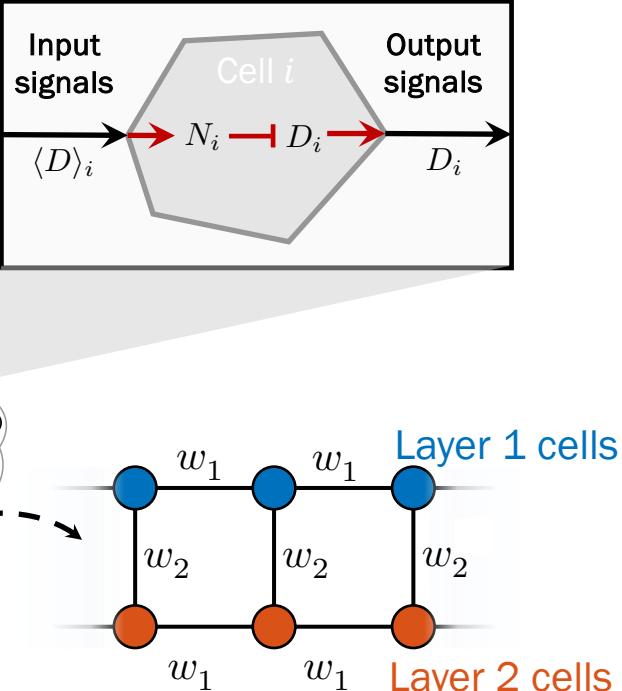
Conditions for stable laminar patterns with lateral-inhibition



$$\frac{w_1}{w_2} < \alpha \frac{n_{cross}}{n_{same}} < 1$$

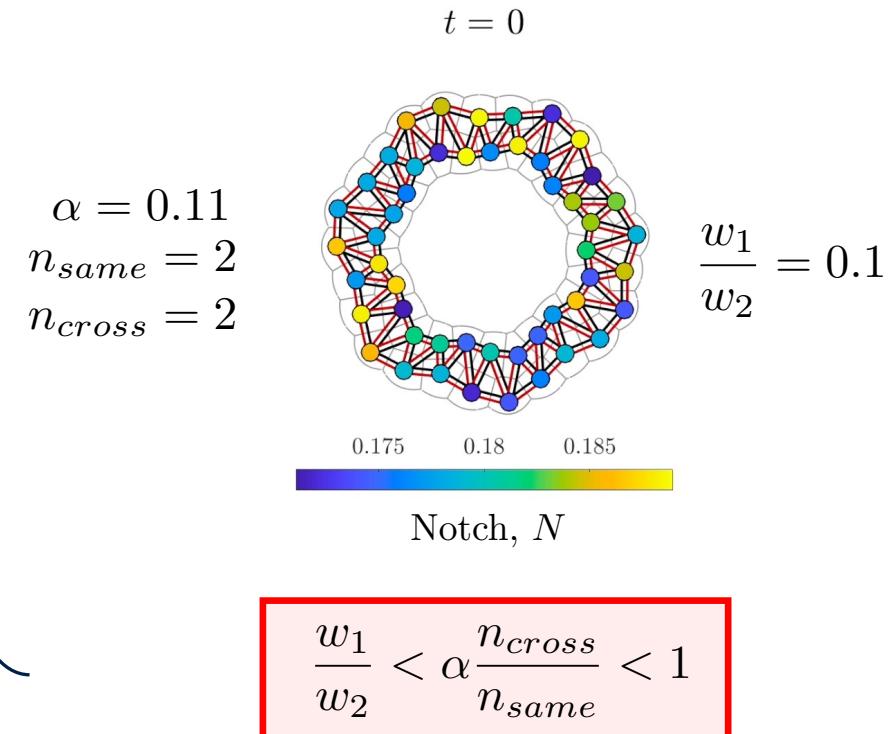
Calibrating polarity control

Network coupled ODEs (IO systems)



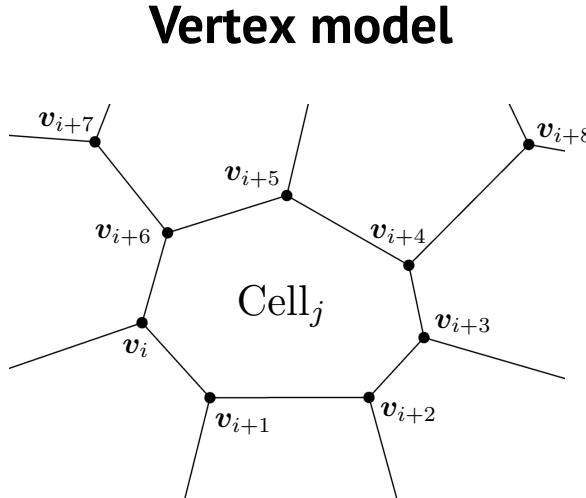
Network quotienting
+
Monotone ODE
theory
+
Control theory

Conditions for stable laminar patterns with lateral-inhibition



But what about spatially dynamic domains?

Simulating growing bilayers



- Cells are represented by non-overlapping polygons
- Vertices of the cells are free to move in 2D-space
- Vertices move due to external and internal forces

Cell shape is important for contact-based patterning!

Forces

$$\mathbf{F}_{i,tot} = \boxed{\mathbf{F}_{i,NH}} + \boxed{\mathbf{F}_{i,LP}} + \boxed{\mathbf{F}_{i,rnd}}$$

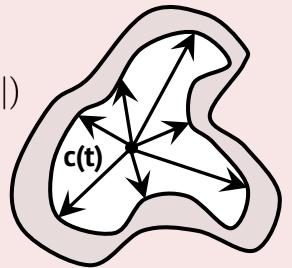
Nagai-Honda:

$$\mathbf{F}_{i,NH} = -\nabla_i \sum_{k \in \mathcal{N}_i} \left(\underbrace{a(A_k - A_{0,k})^2}_{\text{Cell area}} + \underbrace{c(C_k - 2\sqrt{\pi A_{0,k}})^2}_{\text{Cell perimeter}} + \underbrace{\sum_{j=0}^{n_k-1} b_{k,j} d_{k,j}}_{\text{Cell-cell adhesion}} \right)$$

Luminal pressure:

$$\mathbf{F}_{i,LP} = p_1 \frac{\mathbf{r}_i(t) - \mathbf{c}(t)}{\|\mathbf{r}_i(t) - \mathbf{c}(t)\|} \exp(-p_2 \|\mathbf{r}_i(t) - \mathbf{c}(t)\|)$$

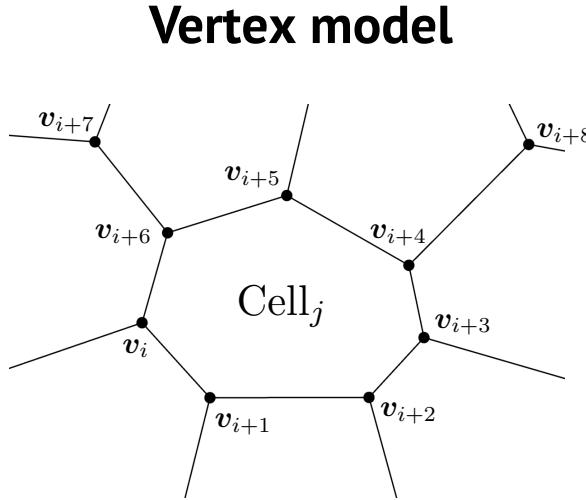
Outward pressure force



Small spatial noise:

$$\mathbf{F}_{i,rnd} = \sqrt{\frac{2\xi}{\Delta t}} \boldsymbol{\nu} \quad \boldsymbol{\nu} \sim \mathcal{N}(0, 1)$$

Simulating growing bilayers



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Forces

$$\mathbf{F}_{i,tot} = \mathbf{F}_{i,NH} + \mathbf{F}_{i,LP} + \mathbf{F}_{i,rnd}$$

First-order vertex dynamics:

$$\eta \frac{d\mathbf{r}_i}{dt} = \mathbf{F}_{i,tot}$$

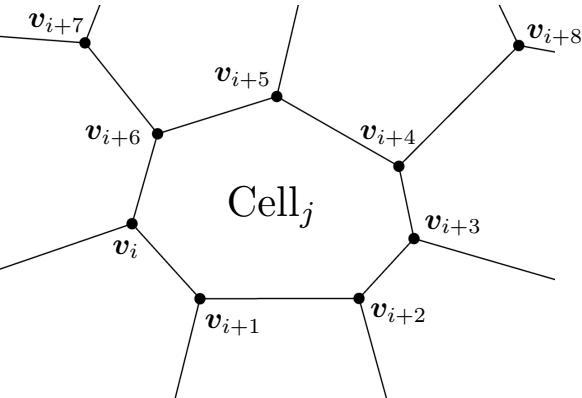
where \mathbf{r}_i is the position of vertex \mathbf{v}_i .

Simulating growing bilayers

Forces

$$\mathbf{F}_{i,tot} = \mathbf{F}_{i,NH} + \mathbf{F}_{i,LP} + \mathbf{F}_{i,rnd}$$

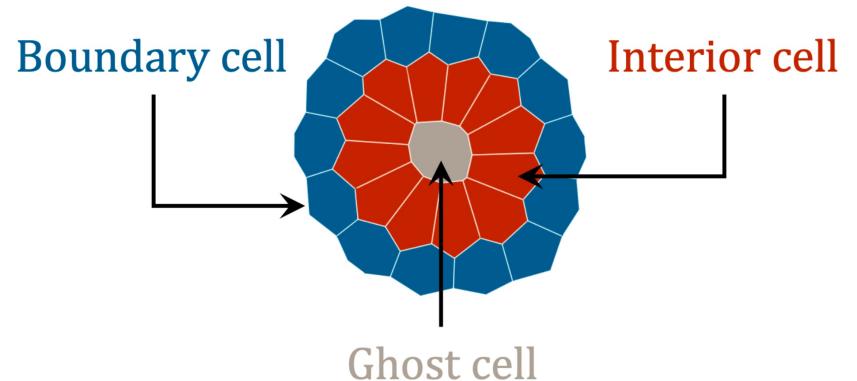
Vertex model



- Cells are represented by non-overlapping polygons
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Cell shape is important for contact-based patterning!

Cell-types



Boundary cells (basal cells):

- If cell is on the boundary

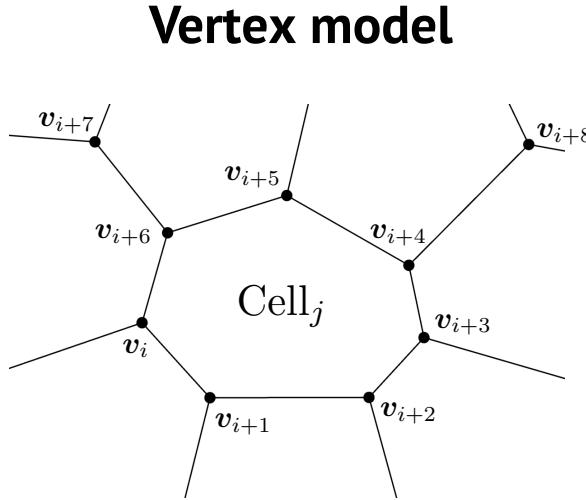
Interior cells (luminal cells):

- If cell is on not the boundary

Ghost cells (lumen - terminal):

- If cell is neighbouring >5 interior cells for >3 hours

Simulating growing bilayers

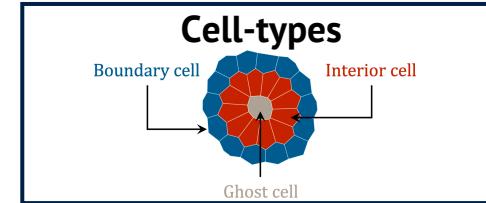


- Cells are represented by non-overlapping polygons
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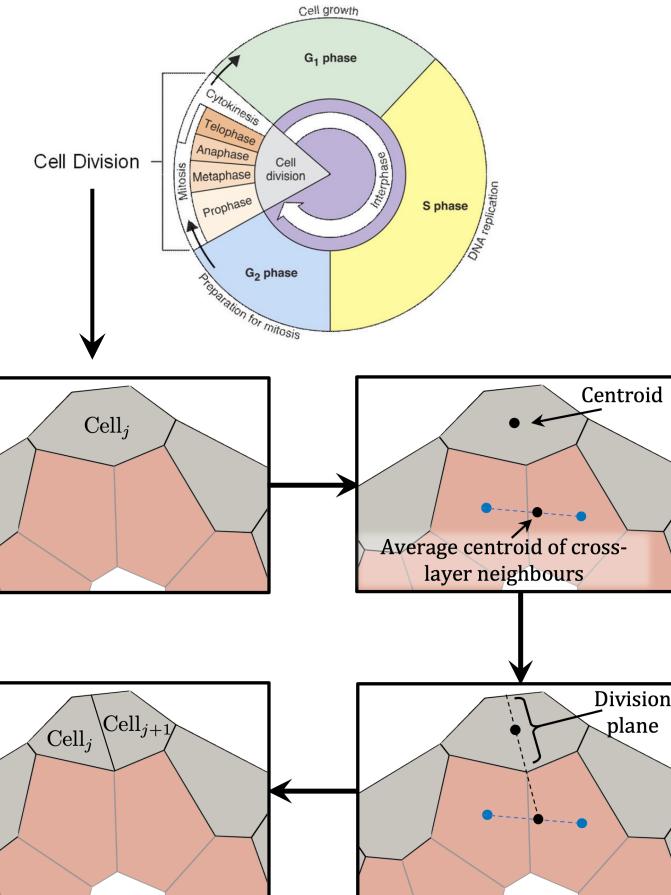
Cell shape is important for contact-based patterning!

Forces

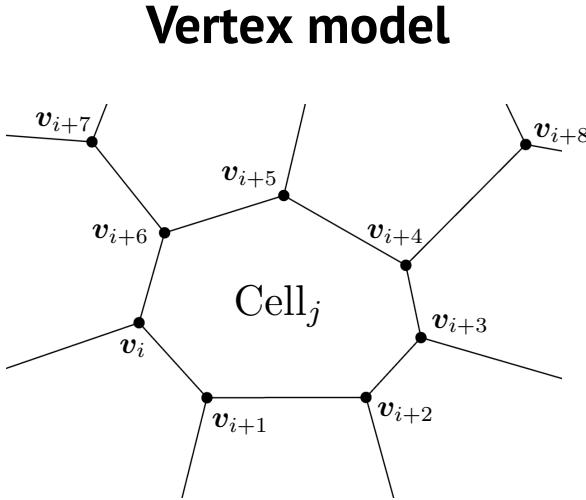
$$\mathbf{F}_{i,tot} = \mathbf{F}_{i,NH} + \mathbf{F}_{i,LP} + \mathbf{F}_{i,rnd}$$



Apical-basal division



Simulating growing bilayers

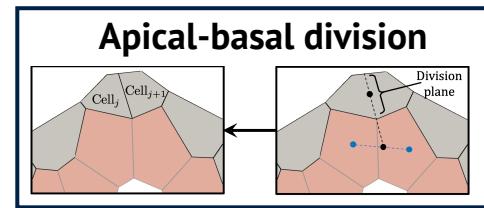
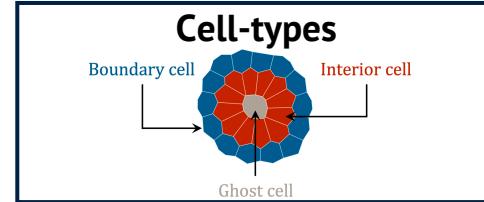


- Cells are represented by non-overlapping polygons
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Cell shape is important for contact-based patterning!

Forces

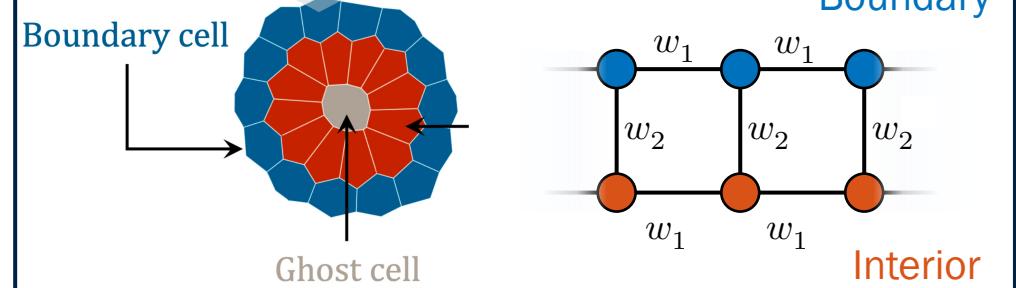
$$\mathbf{F}_{i,tot} = \mathbf{F}_{i,NH} + \mathbf{F}_{i,LP} + \mathbf{F}_{i,rnd}$$



Polarity-dependent Notch signalling

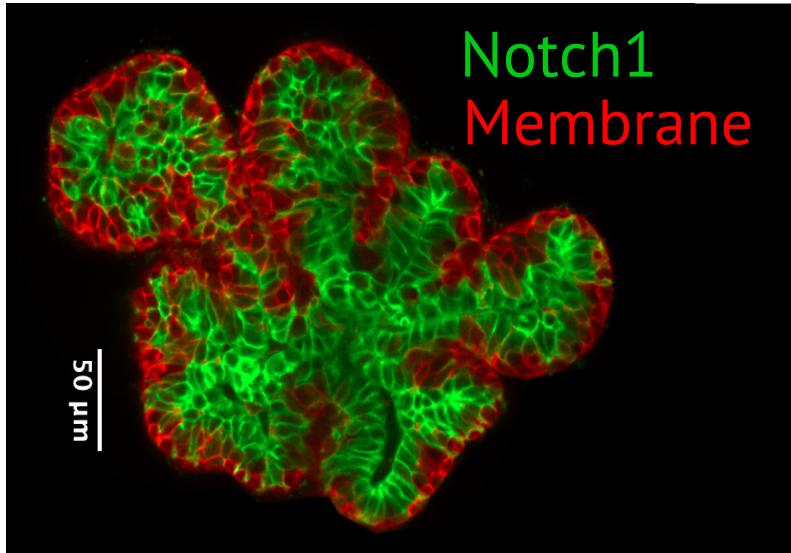
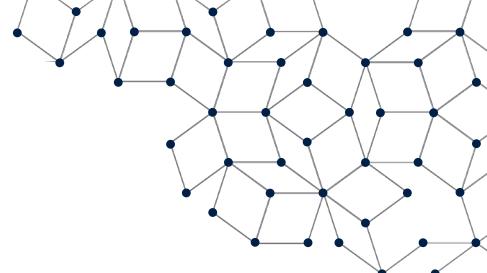
Collier Notch-Delta model

$$\frac{dN_i}{dt} = \frac{\langle D \rangle_i^k}{\alpha + \langle D \rangle_i^k} - N_i$$
$$\frac{dD_i}{dt} = \frac{1}{1 + \beta N^h} - D_i$$

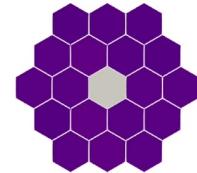




Laminar patterning in growing bilayers



Time: 0



Globally fixed polarity weights for hexagonal grid

$$\frac{w_1}{w_2} < \alpha \frac{n_{cross}}{n_{same}} < 1 \implies \frac{w_1}{w_2} < 0.11$$



Laminar patterning in growing bilayers

Globally fixed polarity weights for hexagonal grid

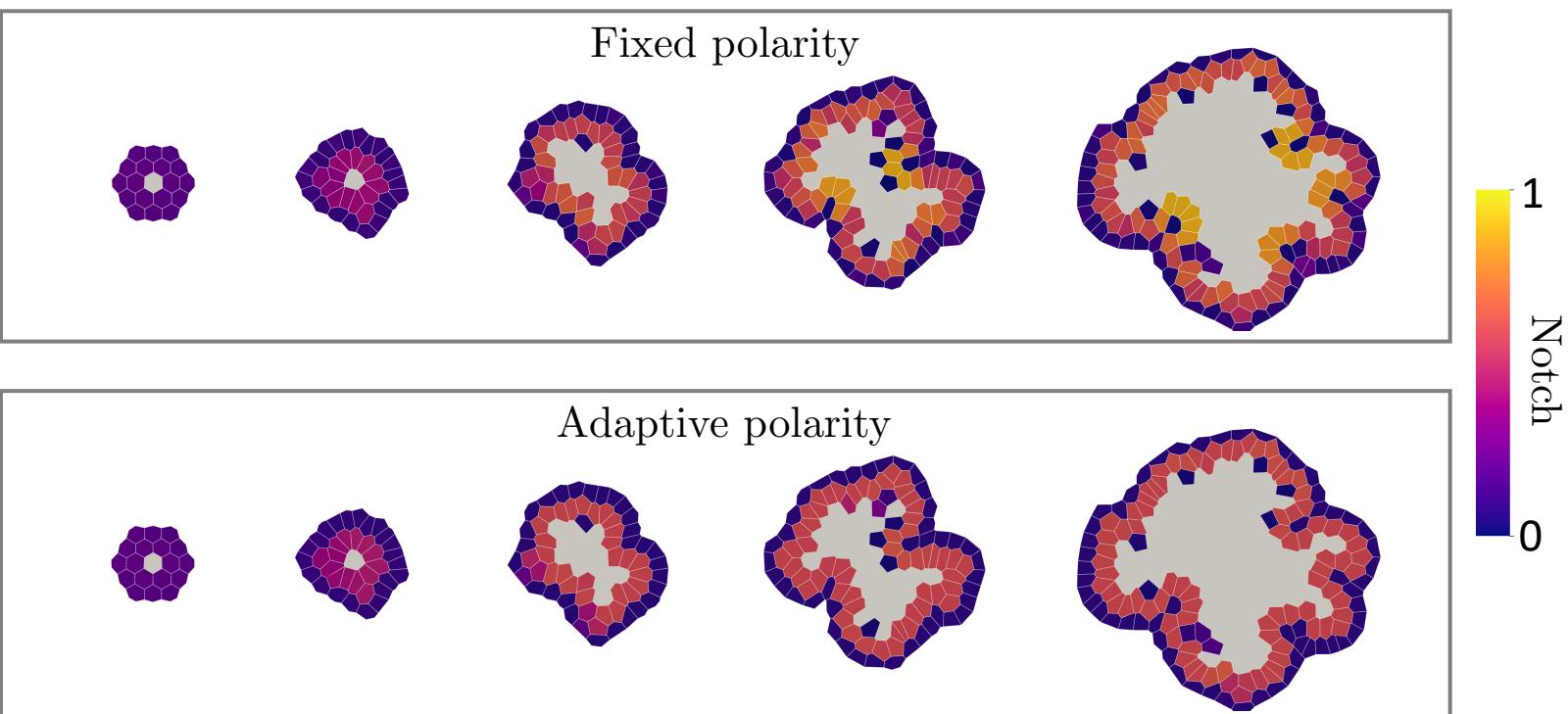
$$\frac{w_1}{w_2} < \alpha \frac{n_{cross}}{n_{same}} < 1 \implies \frac{w_1}{w_2} < 0.11$$

Adaptive polarity weights from cell contacts

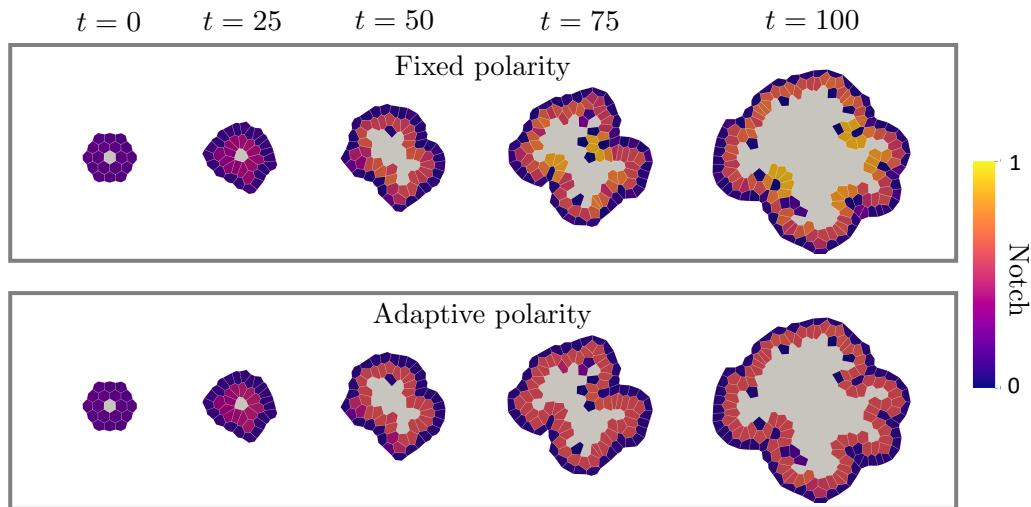
$$\frac{w_1}{w_2} < \alpha \frac{n_{cross}}{n_{same}} < 1 \implies \frac{w_1^{[i]}}{w_2^{[i]}} < 0.11 \frac{n_{cross}^{[i]}}{n_{same}^{[i]}}$$

For each cell_i

$t = 0$ $t = 25$ $t = 50$ $t = 75$ $t = 100$

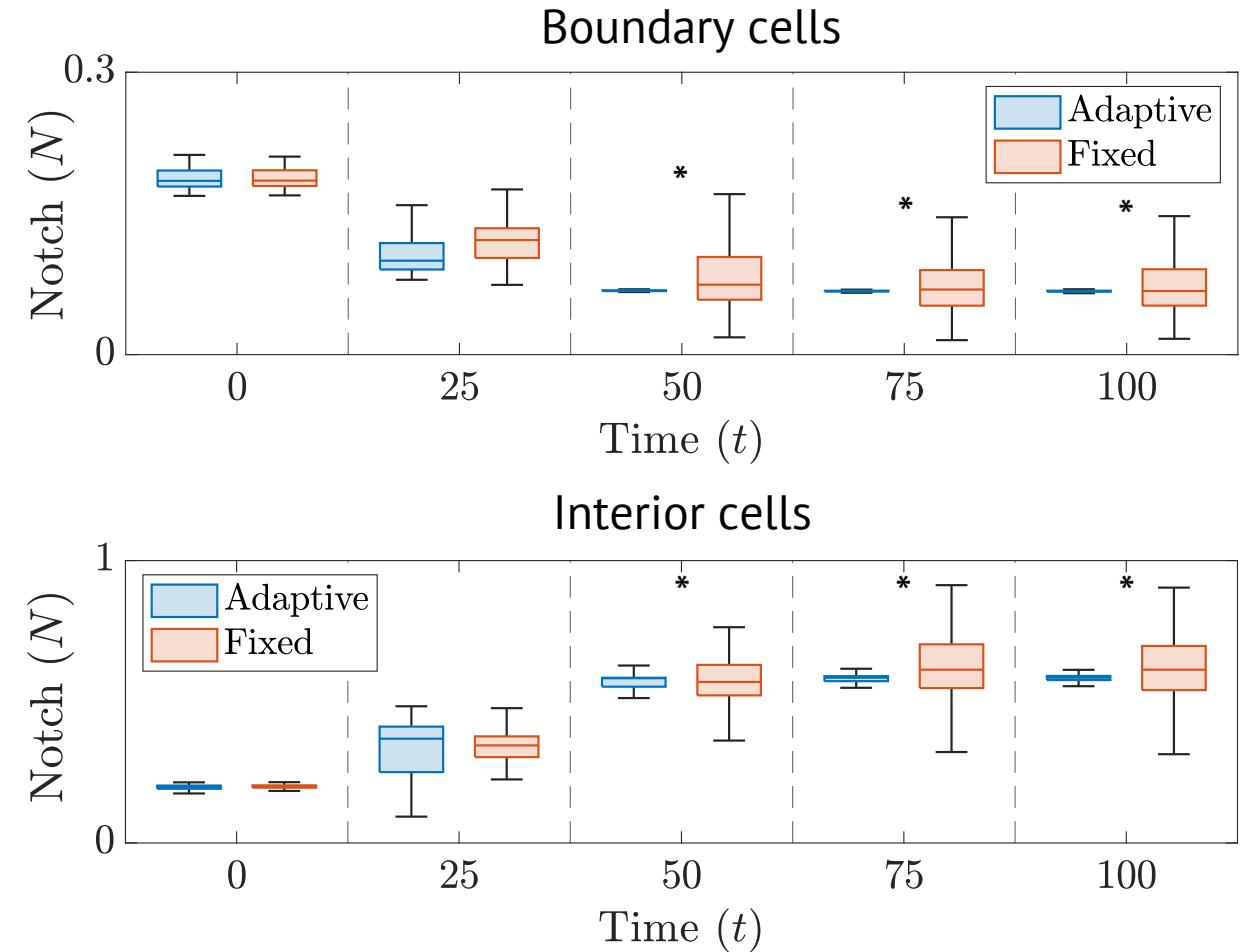


Laminar patterning in growing bilayers



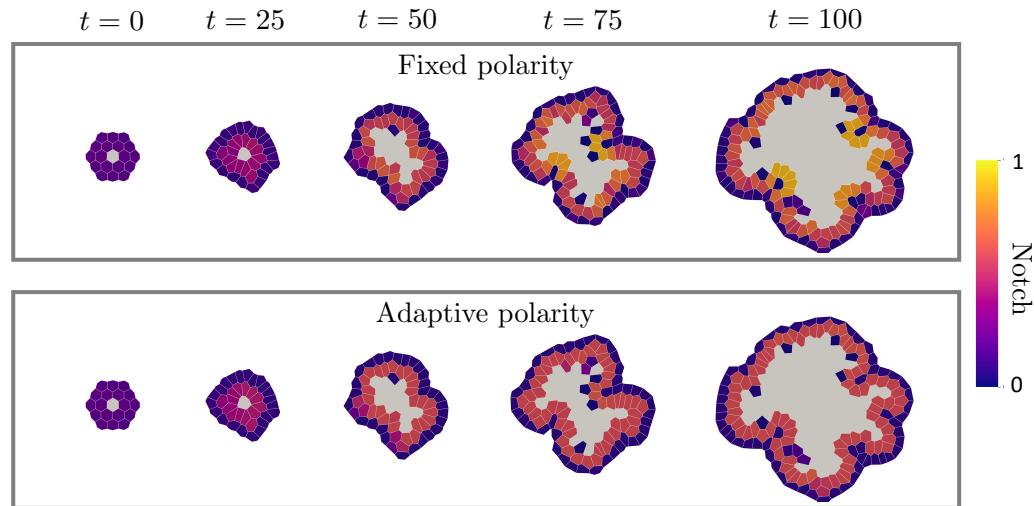
Insights

1. Laminar patterns of Notch can be generated from a simple polarity model.
2. Adaptive polarity provides an additional pattern-stabilising mechanism.

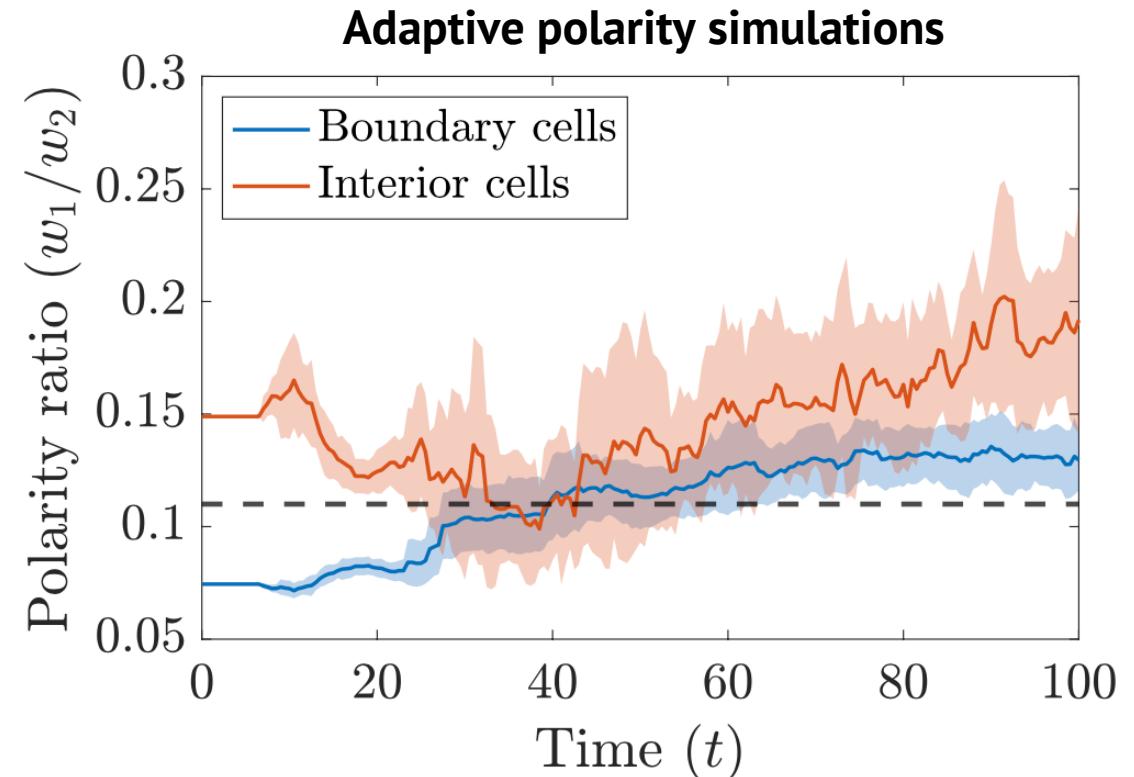


Summary statistics over 10 simulations for each mech. * denotes $p < 0.01$ in Ansari-Bradley variance test.

Laminar patterning in growing bilayers

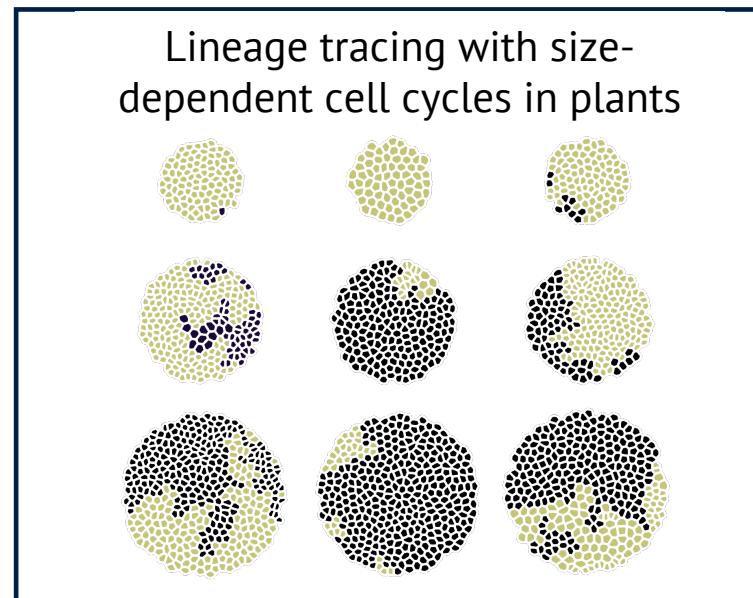
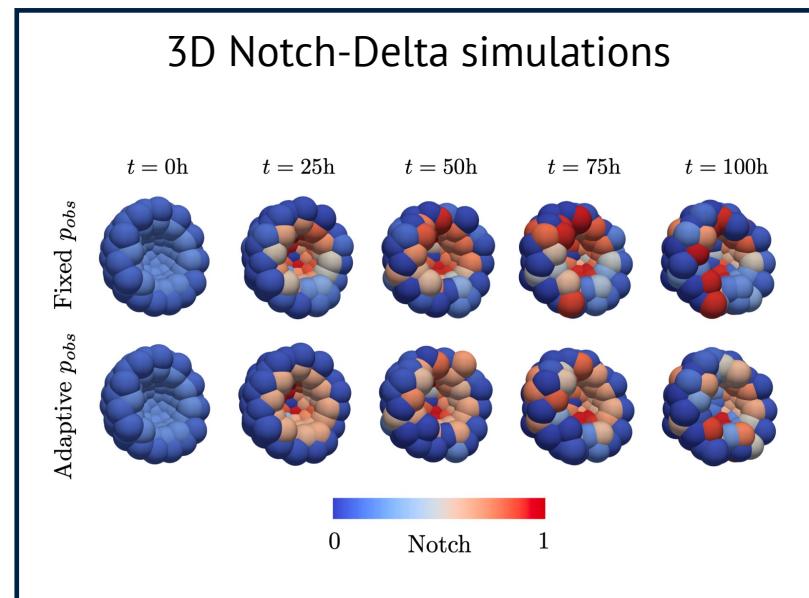
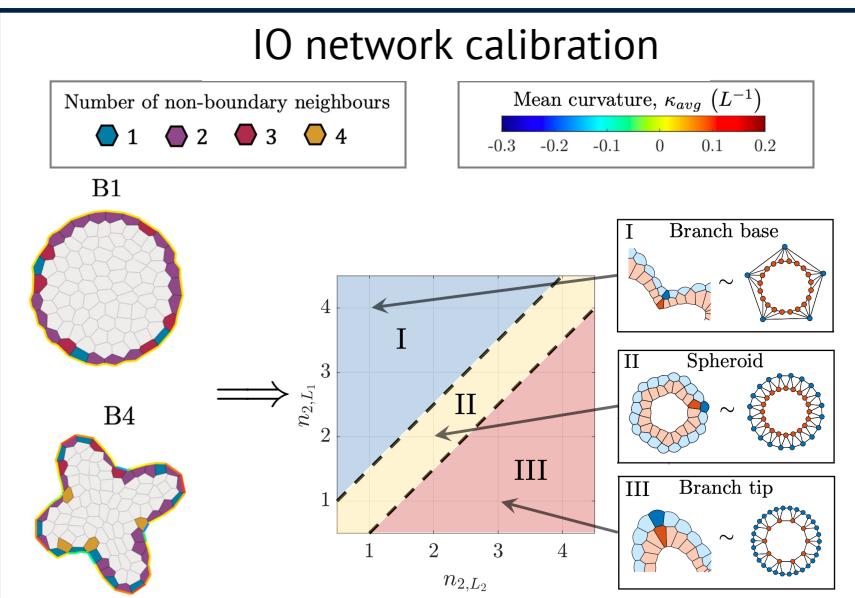


- Insights**
1. Laminar patterns of Notch can be generated from a simple polarity model.
 2. Adaptive polarity provides an additional pattern-stabilising mechanism.
 3. Boundary (basal) cells play a more dominant role in plasticity control.



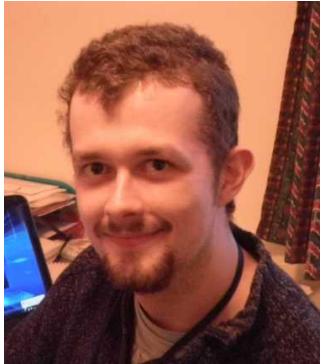
Outlook

1. Promoting polarity in mammary organoid development can stabilise laminar cell fates – *polarity mediated culture conditions*
2. Chaste is a highly versatile and powerful tool for studies in developmental biology:



Acknowledgements

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References + code



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External collaborators:



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Dr Victoria Marsh Durban
(Cellesce)



Dr Mairian Thomas
(Cellesce)



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