


# Biological physics and cell migration



HL-60 cell  
mCherry - utrophin FITC - collagen

Cancerous (leukemic)  
cell crawling through  
polymeric collagen  
environment

Chen... Betzig Science  
2014

Brian Camley

Department of Physics & Astronomy  
Department of Biophysics  
Johns Hopkins University

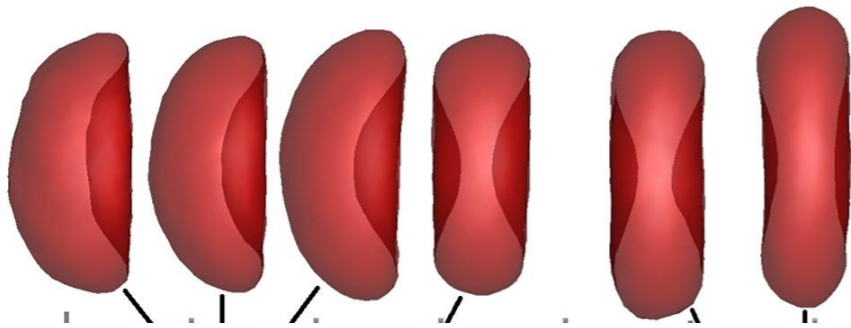
# What is biological physics?

National Academies decadal survey: <https://www.nationalacademies.org/our-work/biological-physicsphysics-of-living-systems-a-decadal-survey>

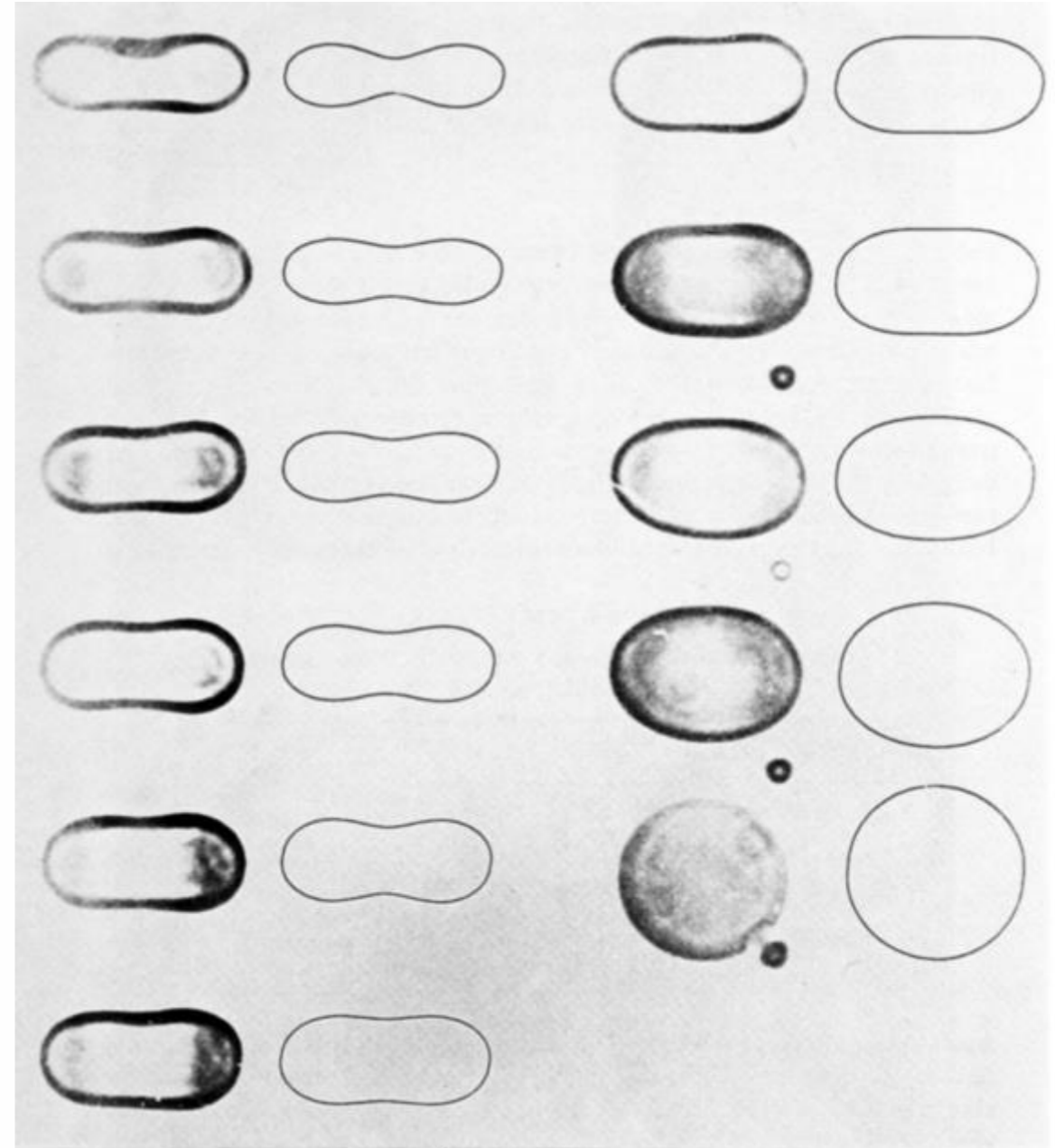
# Huge scope!

Mechanics questions:

Why do red blood cells have their characteristic shapes?



Mauer et al. PLOS ONE 2017



Canham 1968

# Huge scope!

Mechanics questions:

Why do red blood cells have their characteristic shapes?

How can you pack 1 meter of DNA into a nucleus of a cell (a few microns across)?

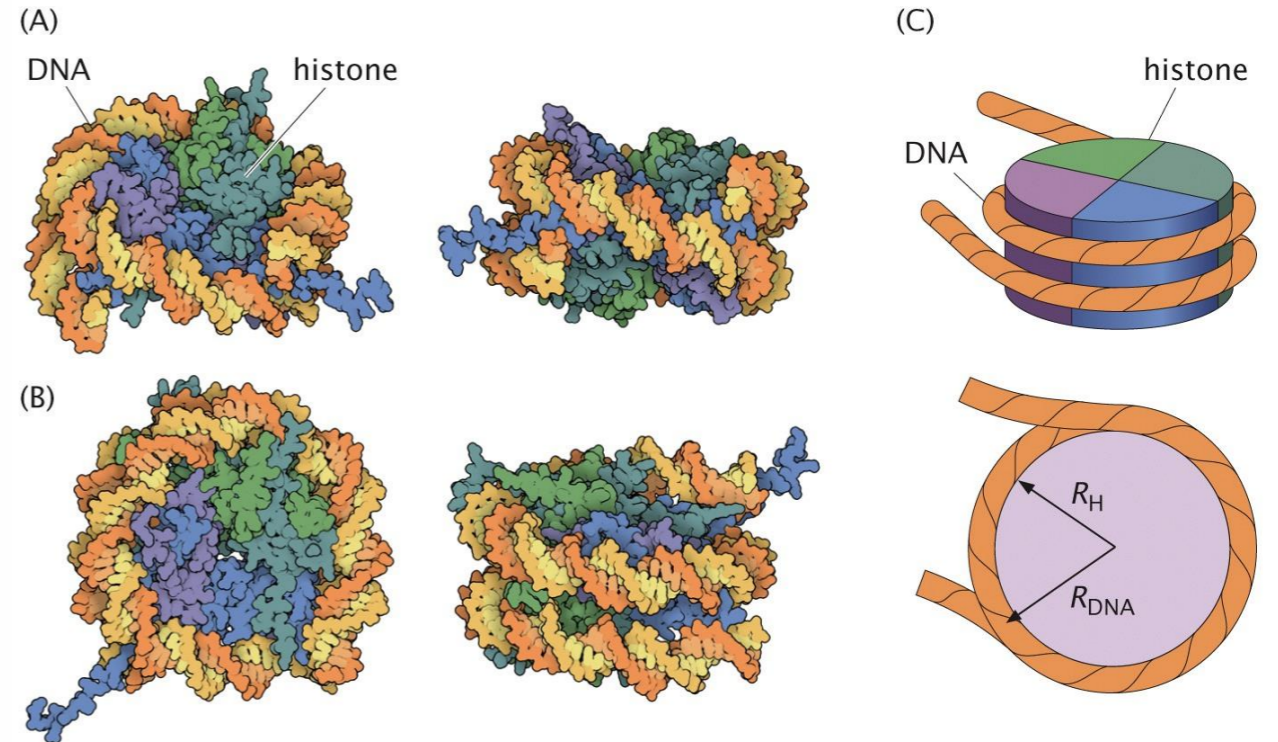


Figure 10.21 Physical Biology of the Cell, 2ed. (© Garland Science 2013)

# Huge scope!

## Mechanics questions:

Why do red blood cells have their characteristic shapes?

How can you pack 1 meter of DNA into a nucleus of a cell (a few microns across)?

## Information questions:

How do cells follow chemical cues?

How does the brain process information reliably?

How do groups of animals cooperate?

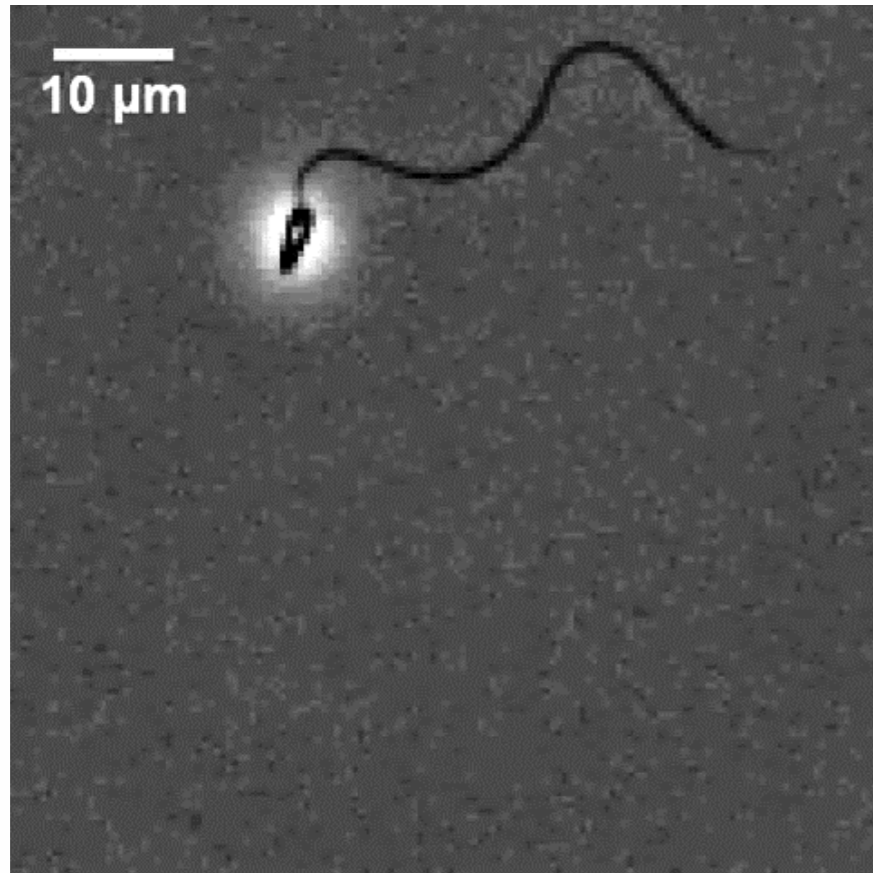
If you're curious: <https://www.nationalacademies.org/our-work/biological-physicsphysics-of-living-systems-a-decadal-survey>

# Swimming at low Reynolds numbers (high friction, low inertia)



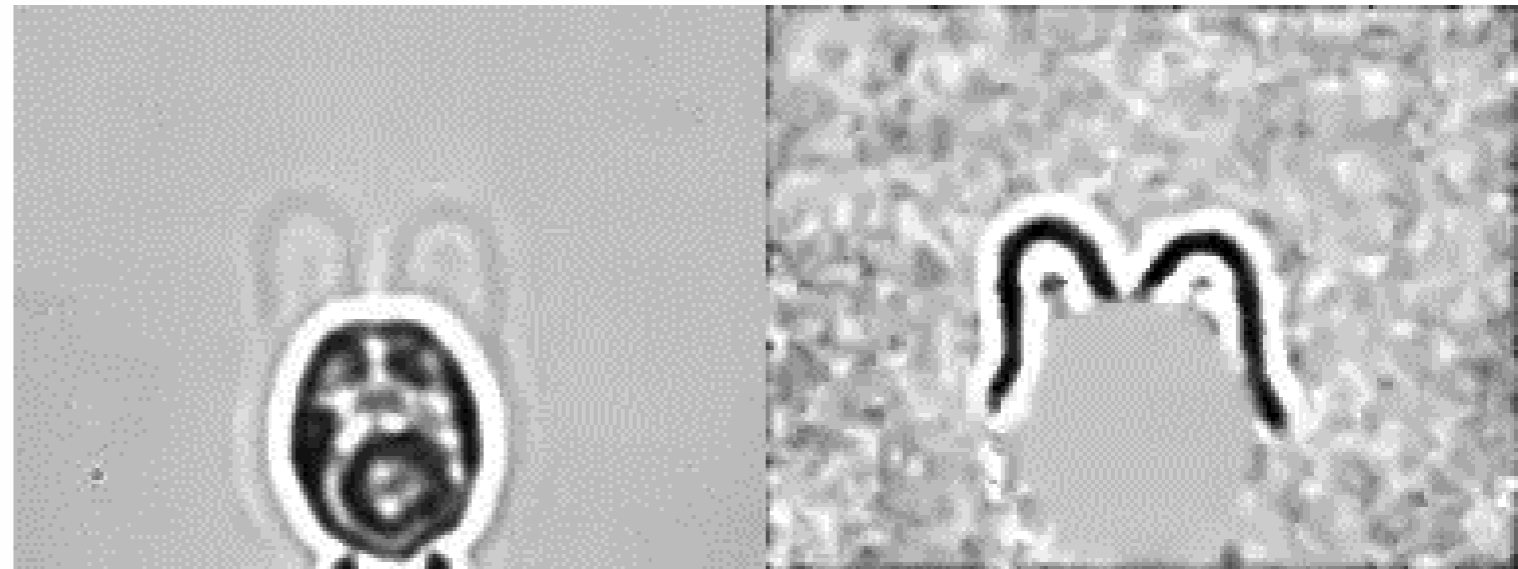
See: “Life at Low  
Reynolds Number”  
by EM Purcell 1977

# Swimming at low Reynolds numbers



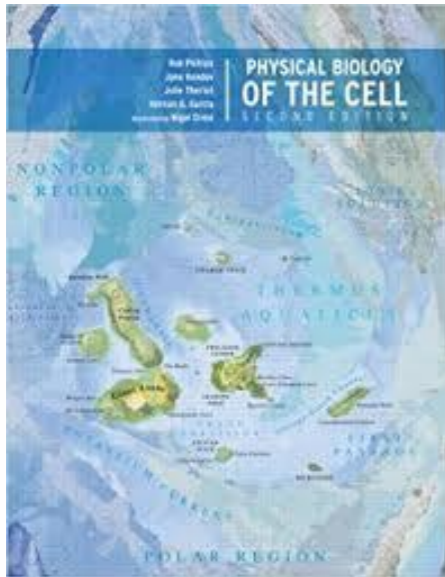
Sea urchin sperm (Jeffrey Guasto lab, Tufts)

Chlamydomonas (K.C Leptos, Ray Goldstein lab)



See: "Life at Low Reynolds Number"  
by EM Purcell 1977

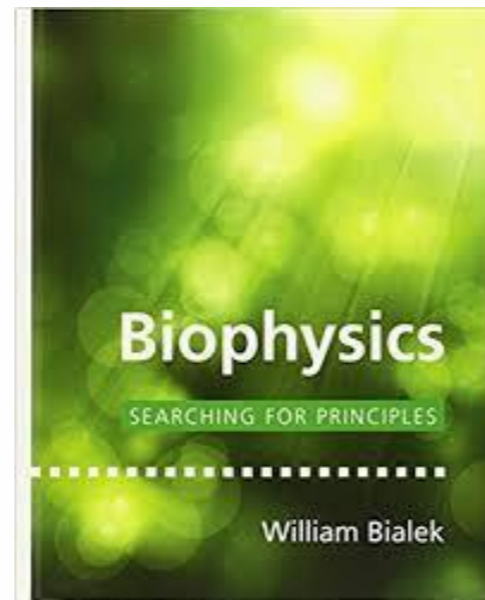
# Some useful textbooks



Physical Biology of the Cell  
Philips, Kondev, Theriot, Garcia

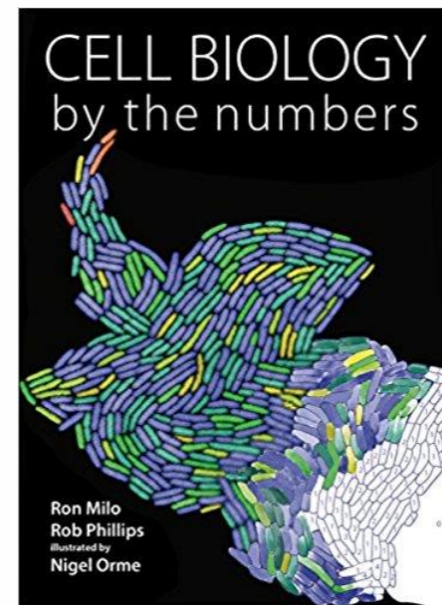
Giant, useful reference  
Digital copies of  
illustrations on website

(draft copy freely available on  
Bialek's website)

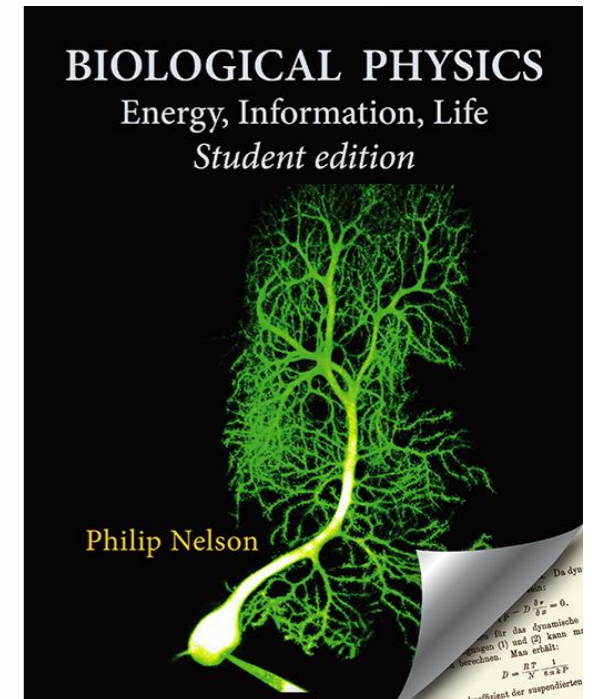


Biophysics:  
Searching for Principles  
Bialek

Lots of material online: [bionumbers.org](http://bionumbers.org)



Cell Biology by the numbers  
Milo and Philips



Biological Physics  
Has some advanced material  
but most requires  
no math beyond calc  
(~\$30 in print, \$10 kindle)



# Story 1: Collective Chemotaxis, or How Cells Work Together by Competing



# Chemotaxis in a single cell

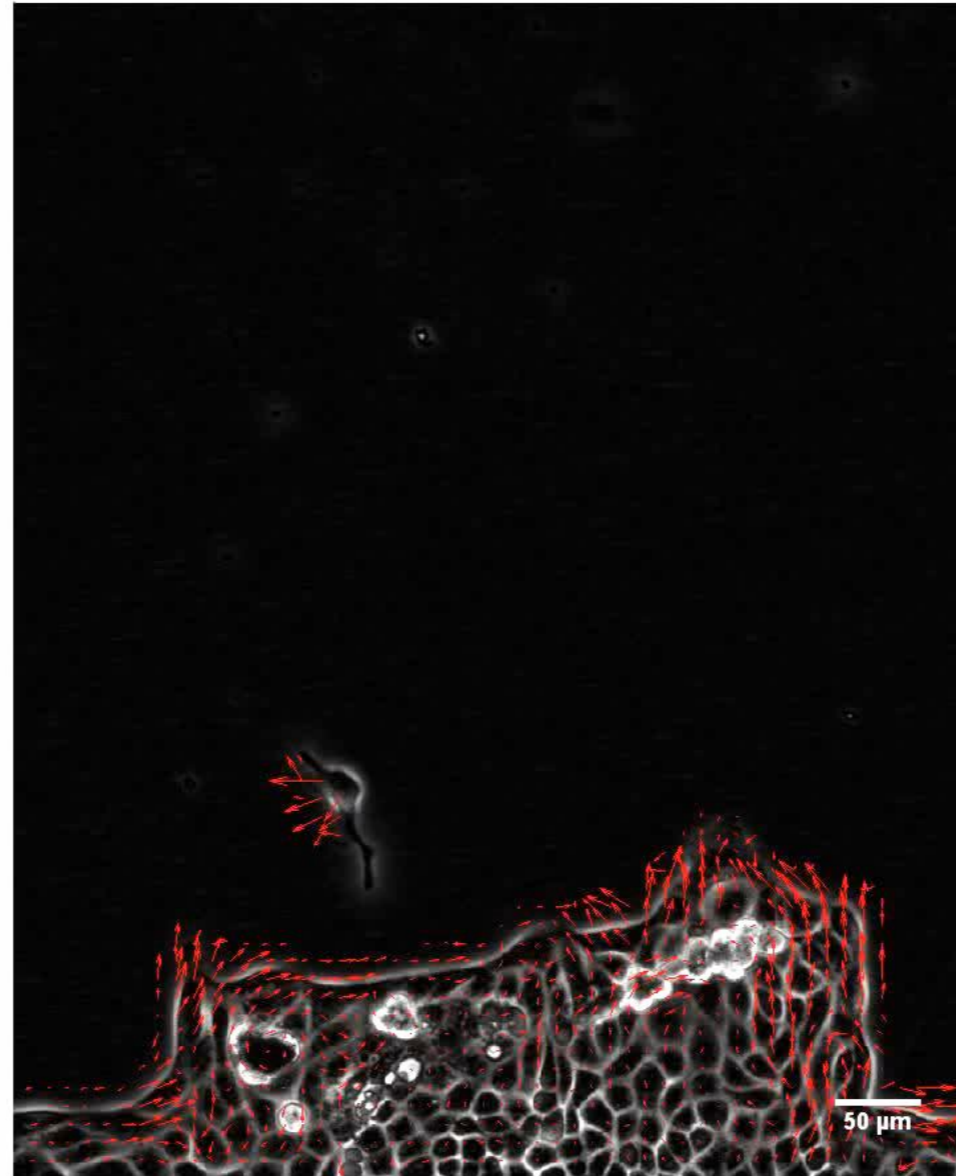


| ~15  $\mu\text{m}$

About 60x realtime

*Dictyostelium* movie from RA Firtel group, UCSD

# Collective cell motility



1 second = 2 hrs  
20 min real time

Vedula et al.  
PNAS 2012

400 microns



How does a collection of cells follow  
a chemical signal?

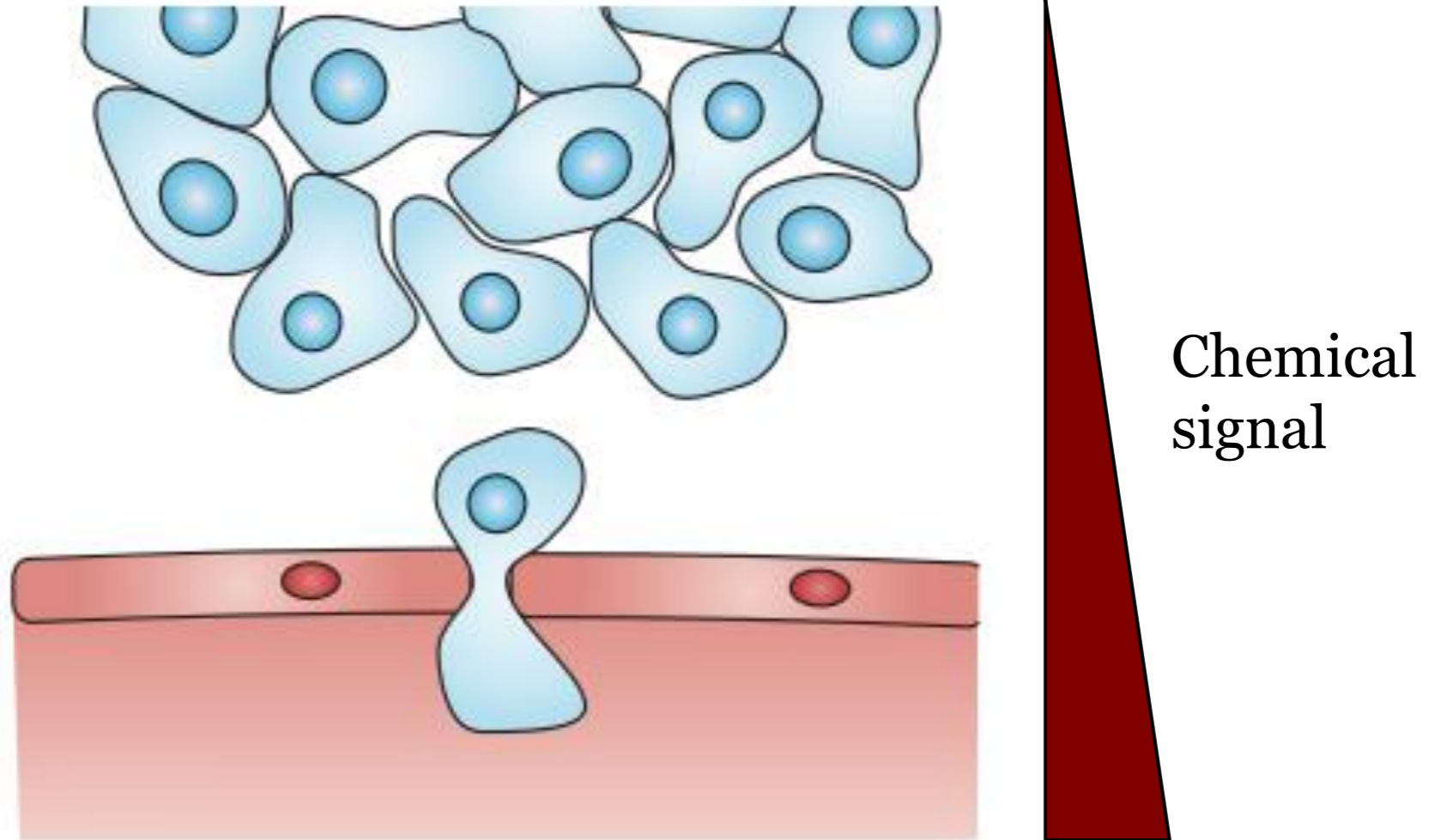
# Why study chemotaxis?



**Neutrophil chasing bacterium**  
originally taken by David Rogers;  
<http://biochemweb.org/neutrophil.shtml>

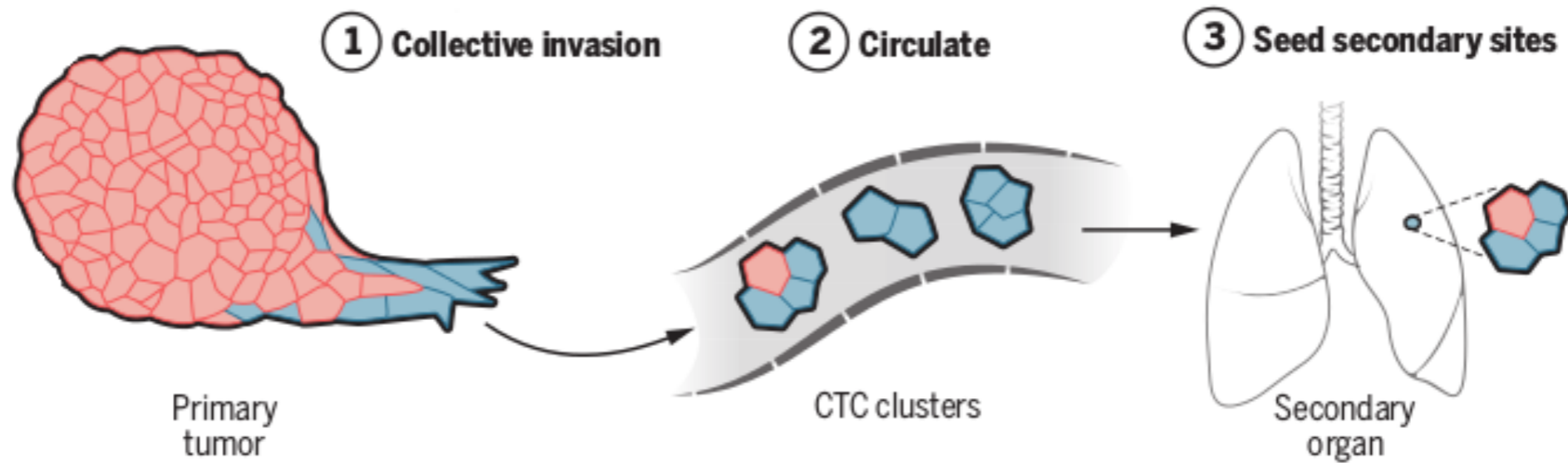
# Why study chemotaxis?

Tumor



See, e.g. "Chemotaxis in Cancer" Nat. Rev. Cancer 2011

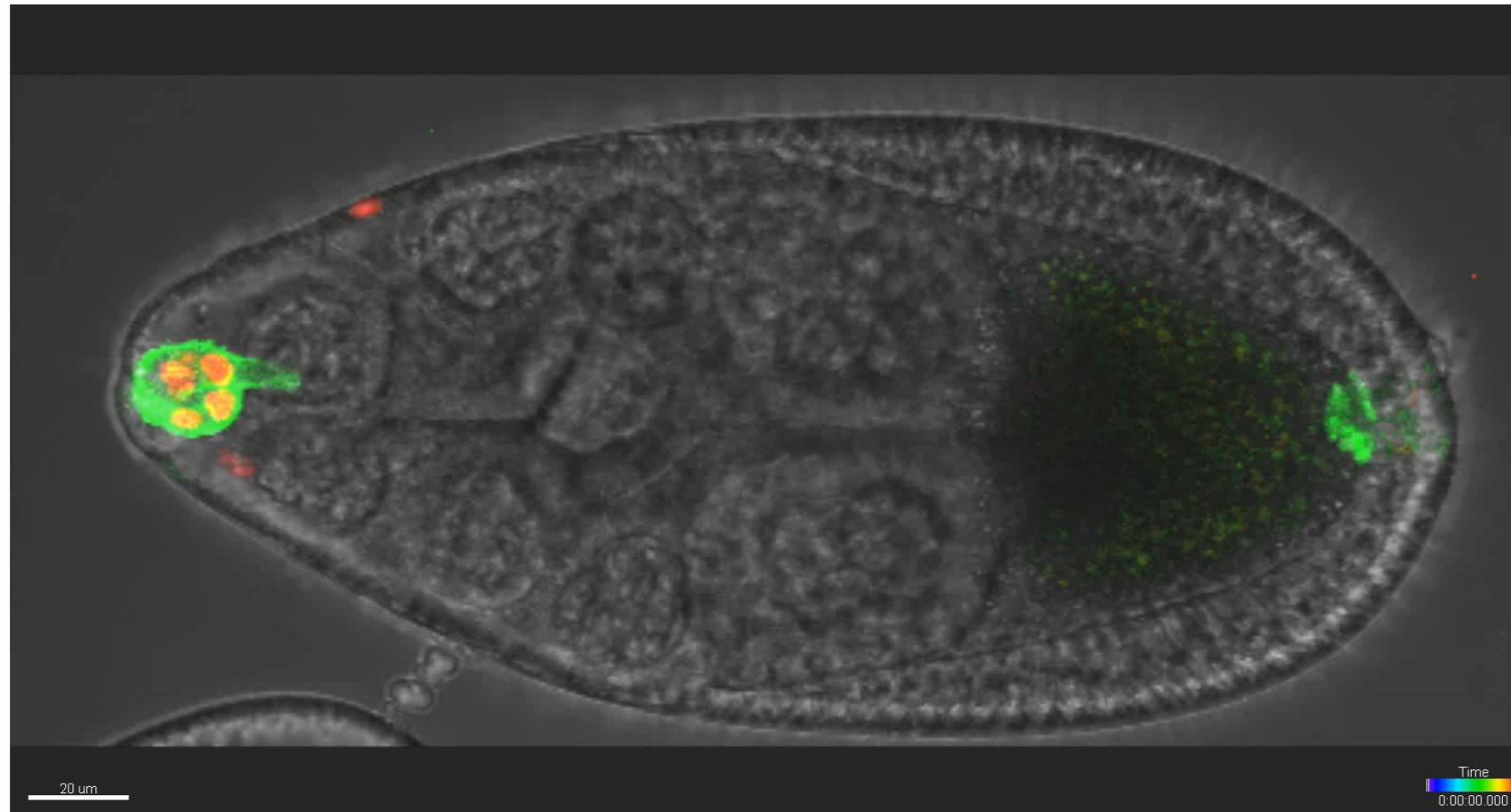
# Why study clusters?



Cheung and Ewald, Science, 2016

# Why study clusters?

Cells in the developing embryo travel together, too



Drosophila egg chamber: movie courtesy Wei Dai (Denise Montell group, UCSB)



Why do physicists bring to chemotaxis  
and cell motility?

# Why should physicists study chemotaxis and cell motility?

Cells are soft matter



# Why should physicists study chemotaxis and cell motility?

Cells are soft matter



Cell motion is stochastic



# Why should physicists study chemotaxis and cell motility?

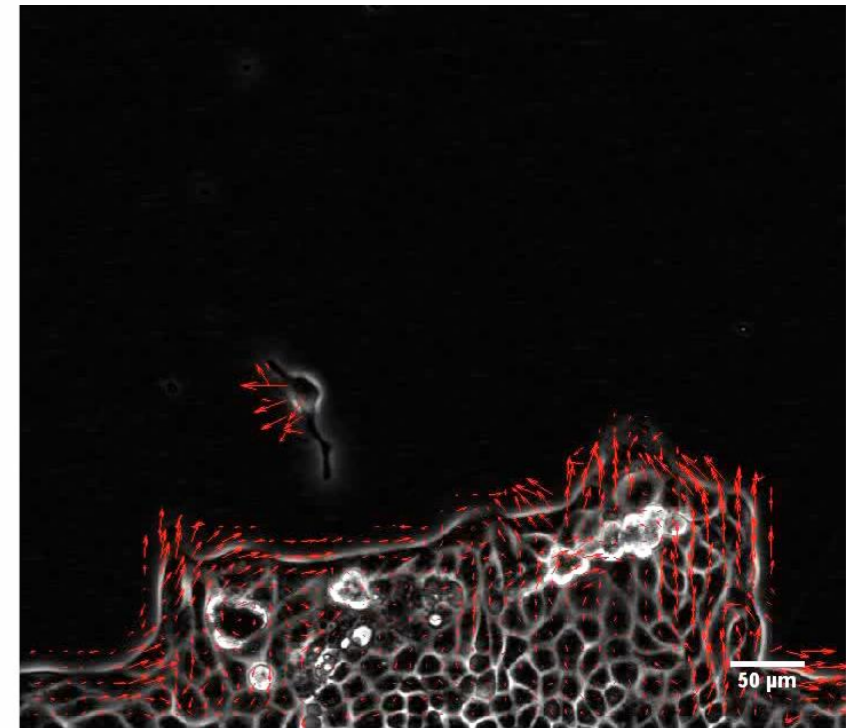
Cells are soft matter



Cell motion is stochastic



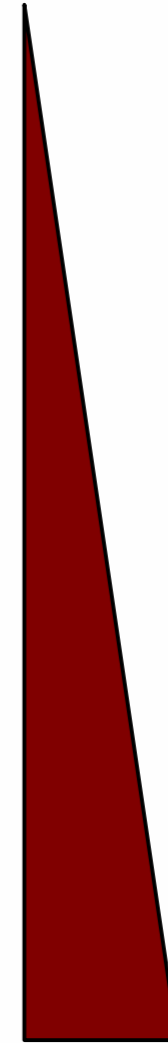
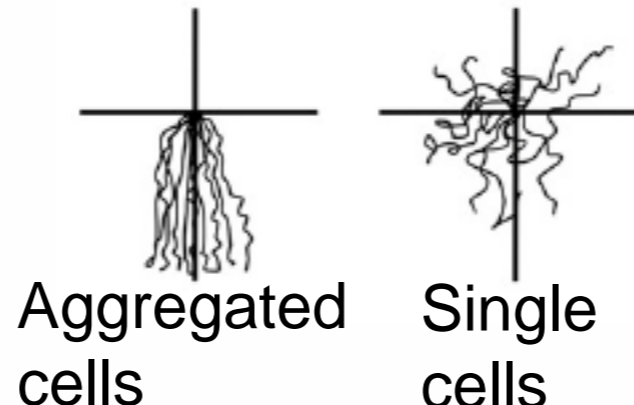
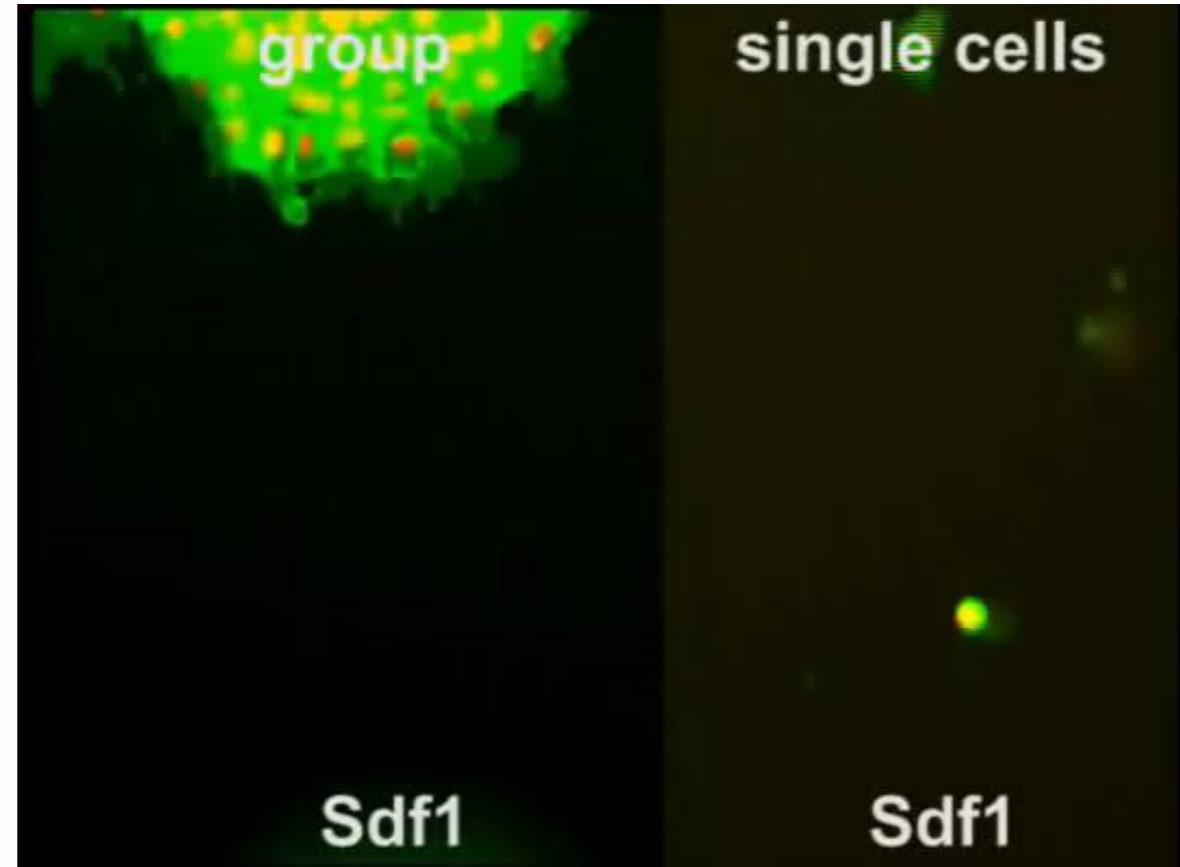
Collections of cells have emergent behaviors



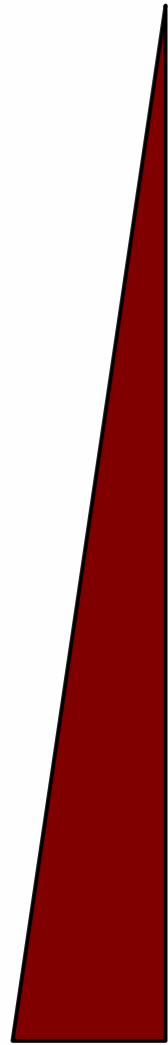



# Interesting observations on collective gradient sensing

# Neural crest chemotaxis *in vitro*



# Lymphocytes being chemorepelled?

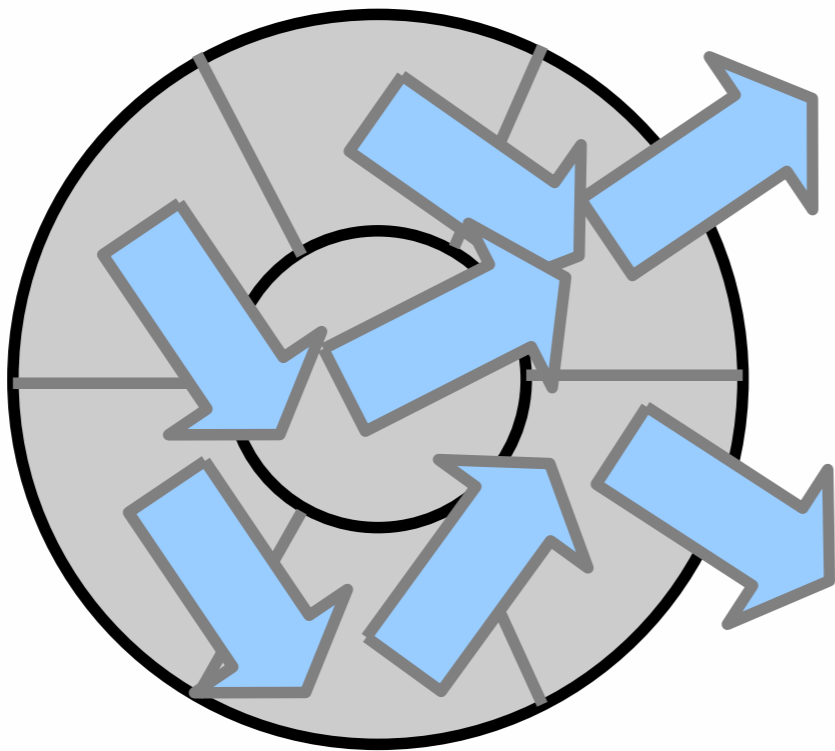




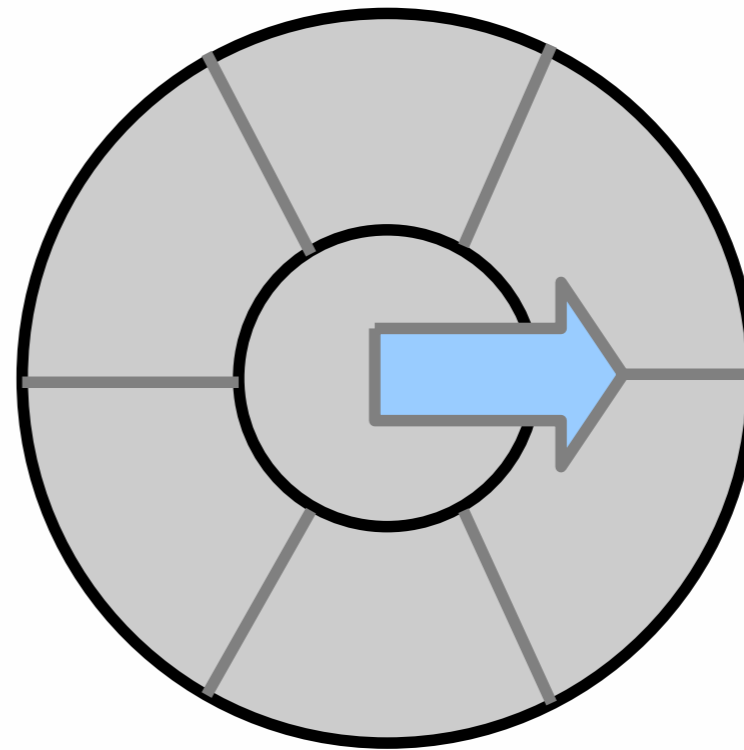
How can a cluster of cells follow a gradient when the individual cells don't?



# “Many wrongs”



Noisy single-cell polarities

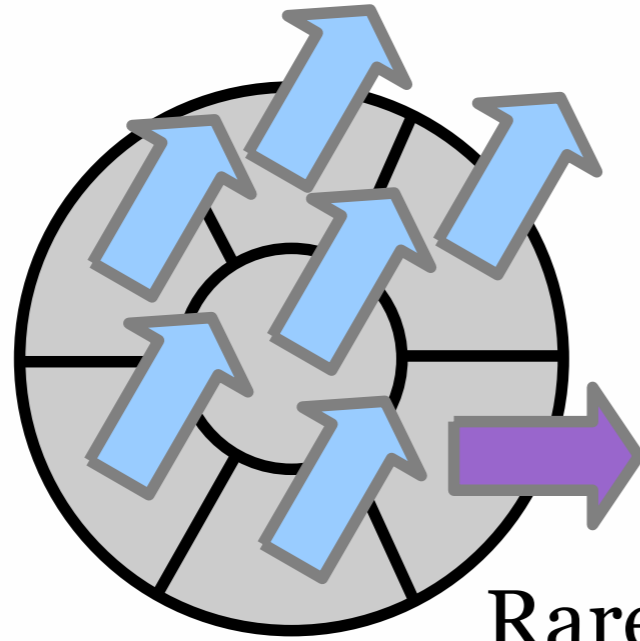


Cluster motion is less noisy

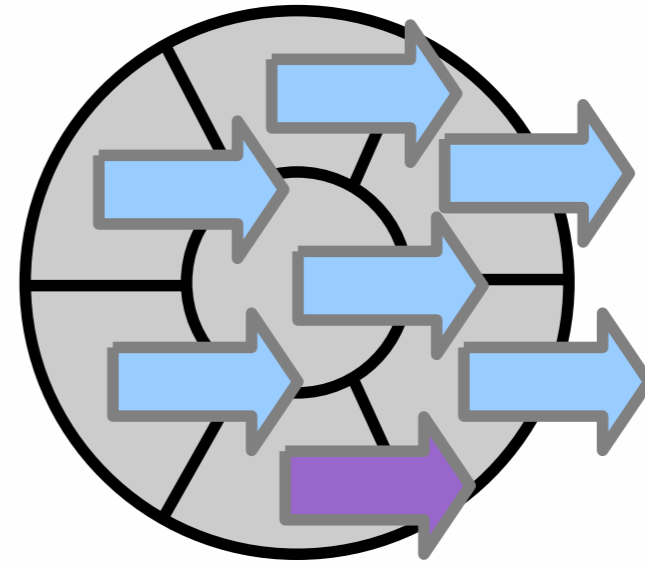
Signal  $S(\mathbf{r})$

# “Collective susceptibility”

Cells align



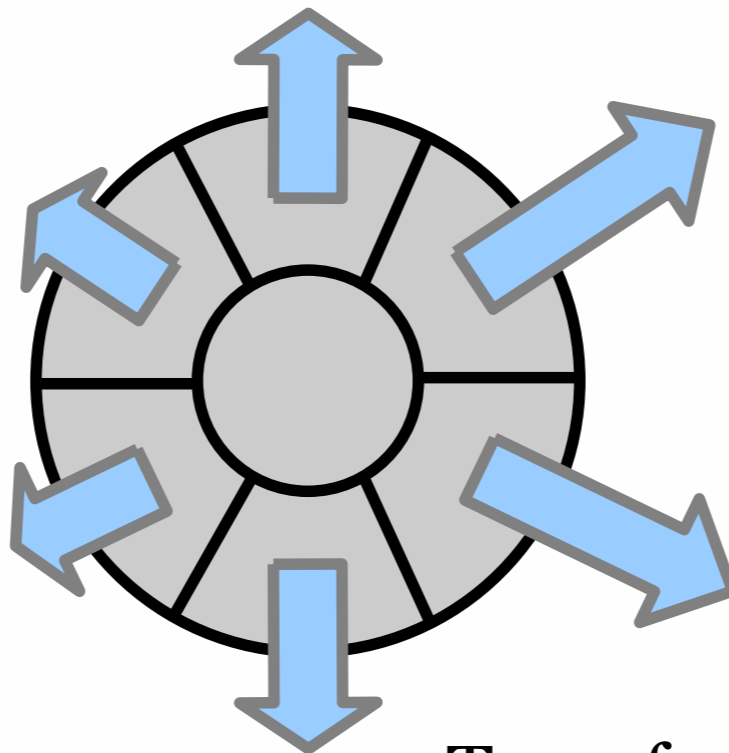
Rare cells sense  
gradient



Signal  $S(\mathbf{r})$

# “Collective guidance”

Cells sense  
*level* of  
signal



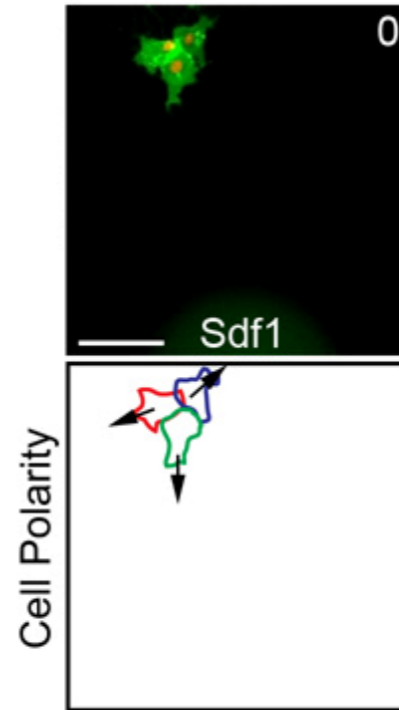
Tug-of-war



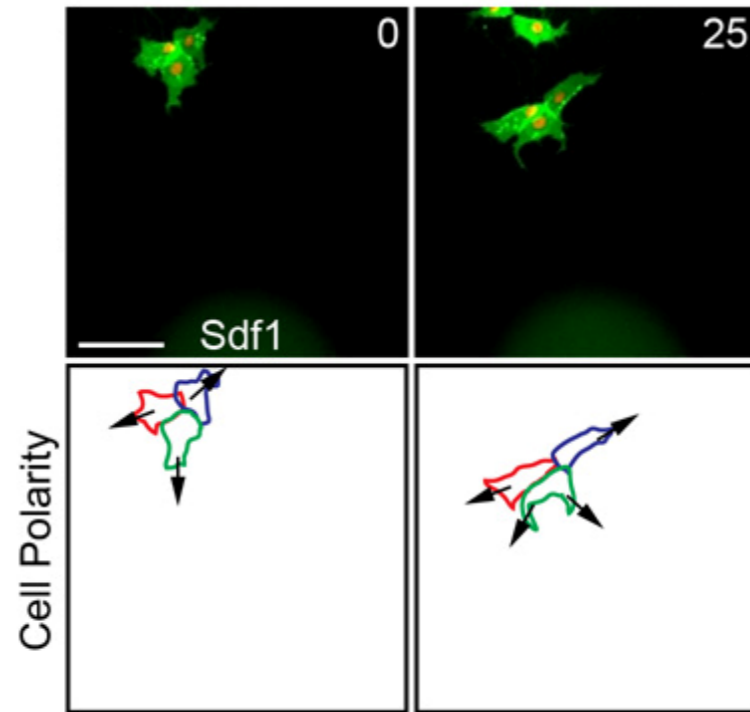
Signal  $S(r)$

# A minimal model for “collective guidance” in neural crest

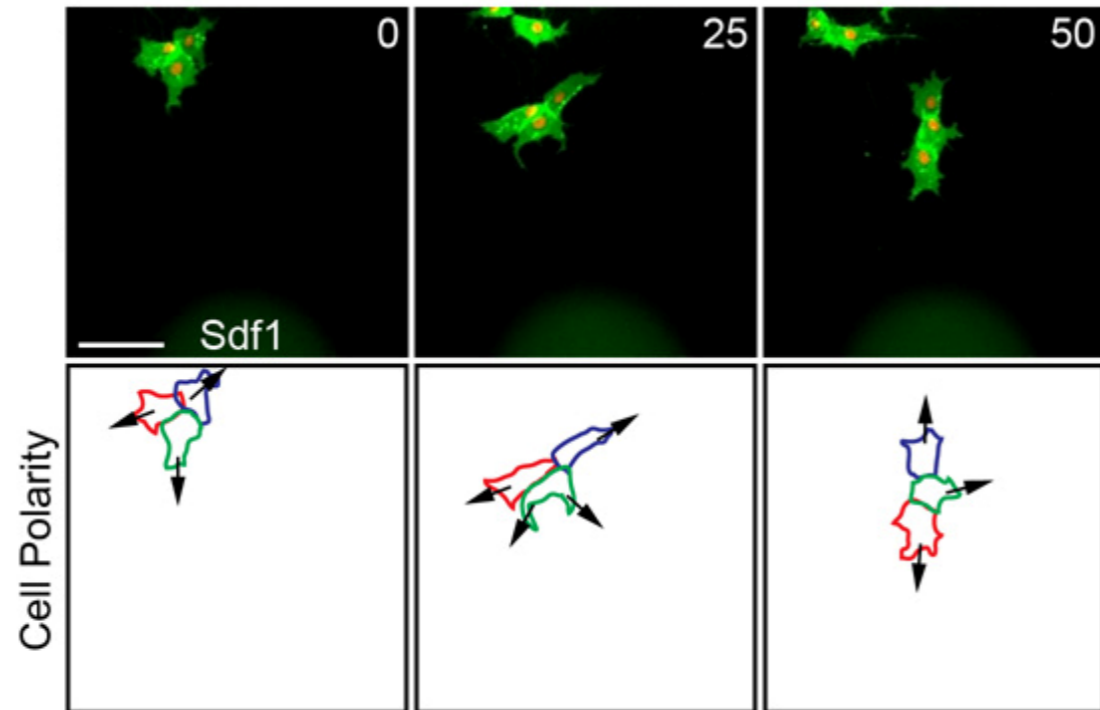
# Contact inhibition of locomotion (CIL)



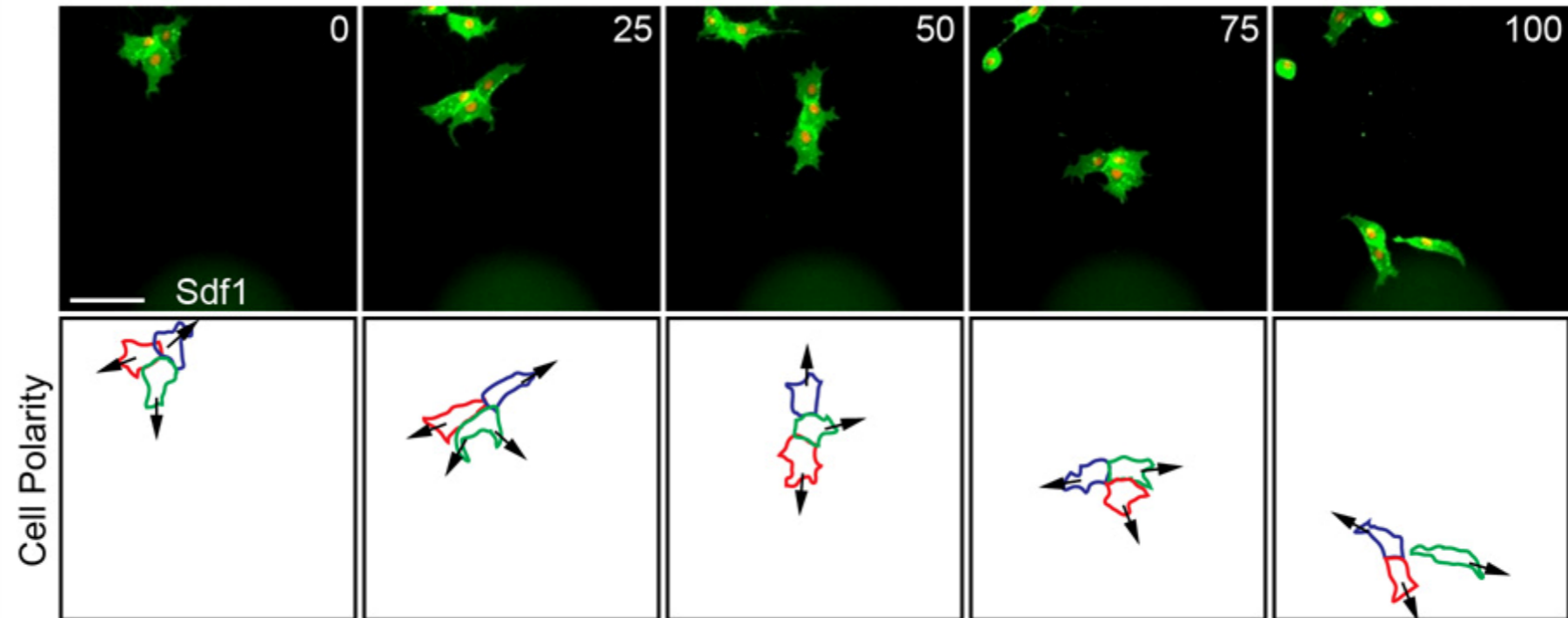
# Contact inhibition of locomotion (CIL)



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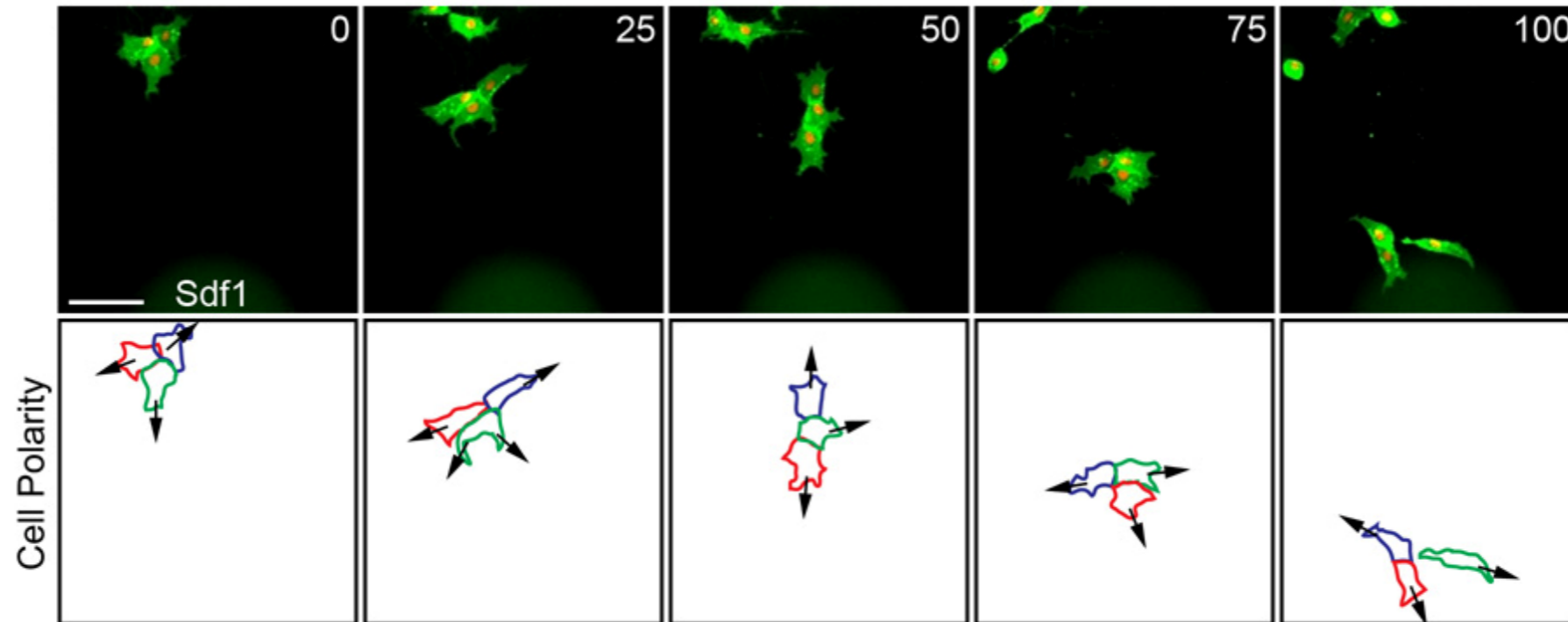


# Contact inhibition of locomotion (CIL)





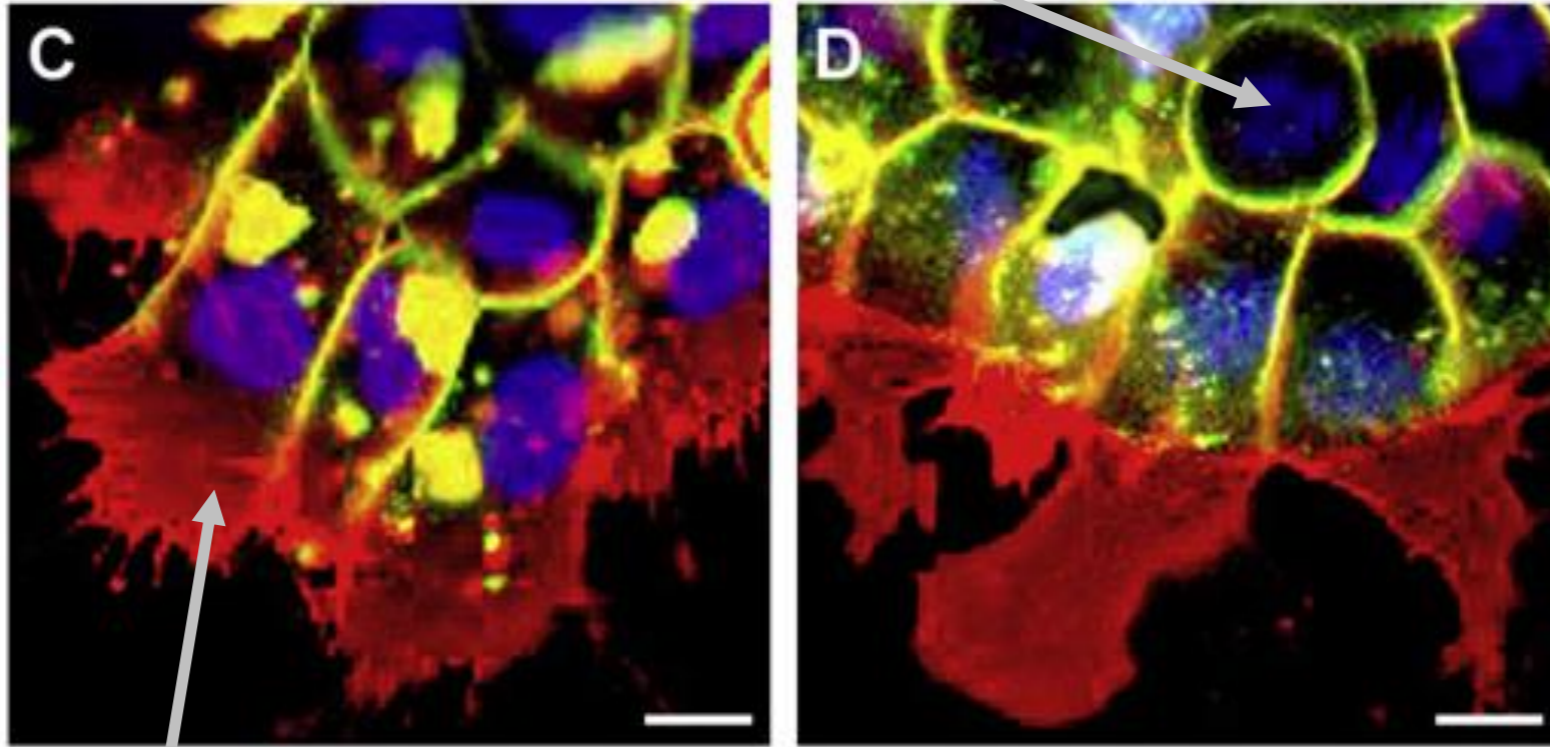
# Contact inhibition of locomotion (CIL)



**Neural crest cells protrude away  
from contact**

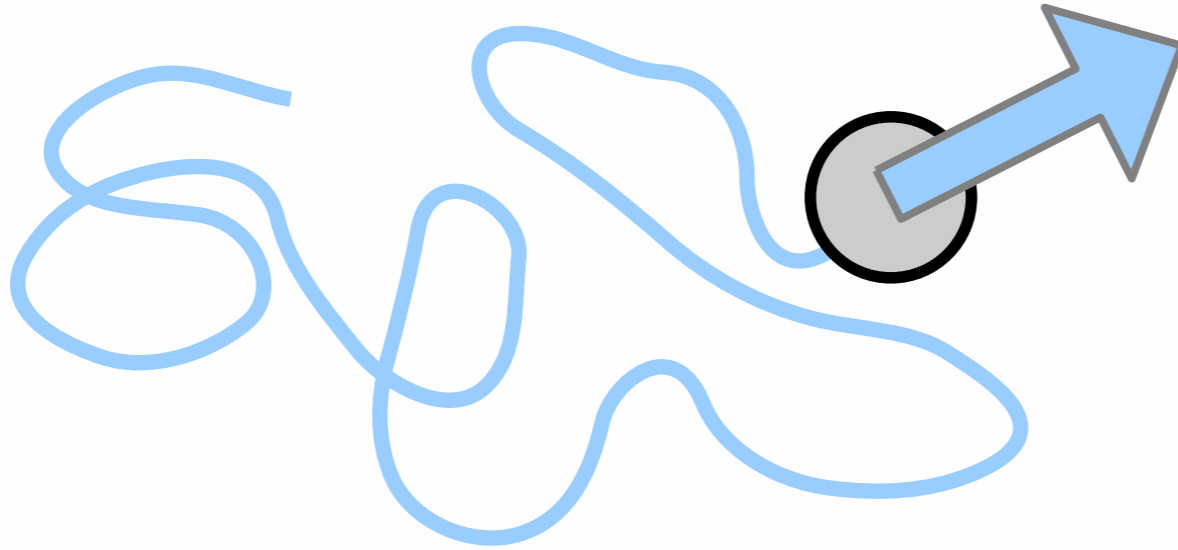
# Contact inhibition of locomotion

Inner cells have no protrusions



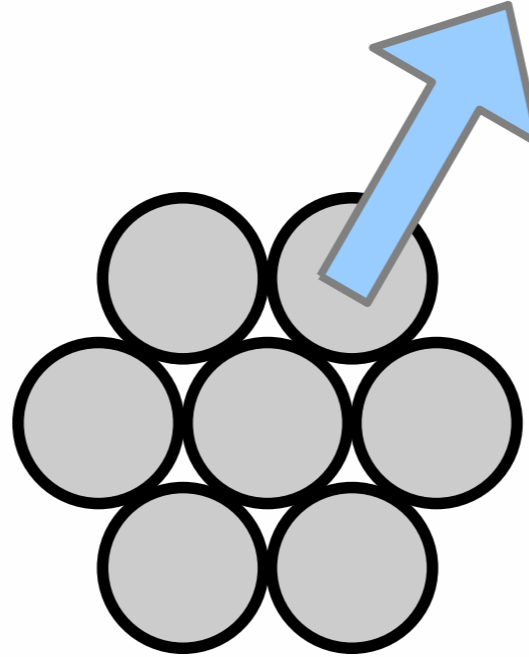
Outer cells have outward protrusions

# Stochastic particle model



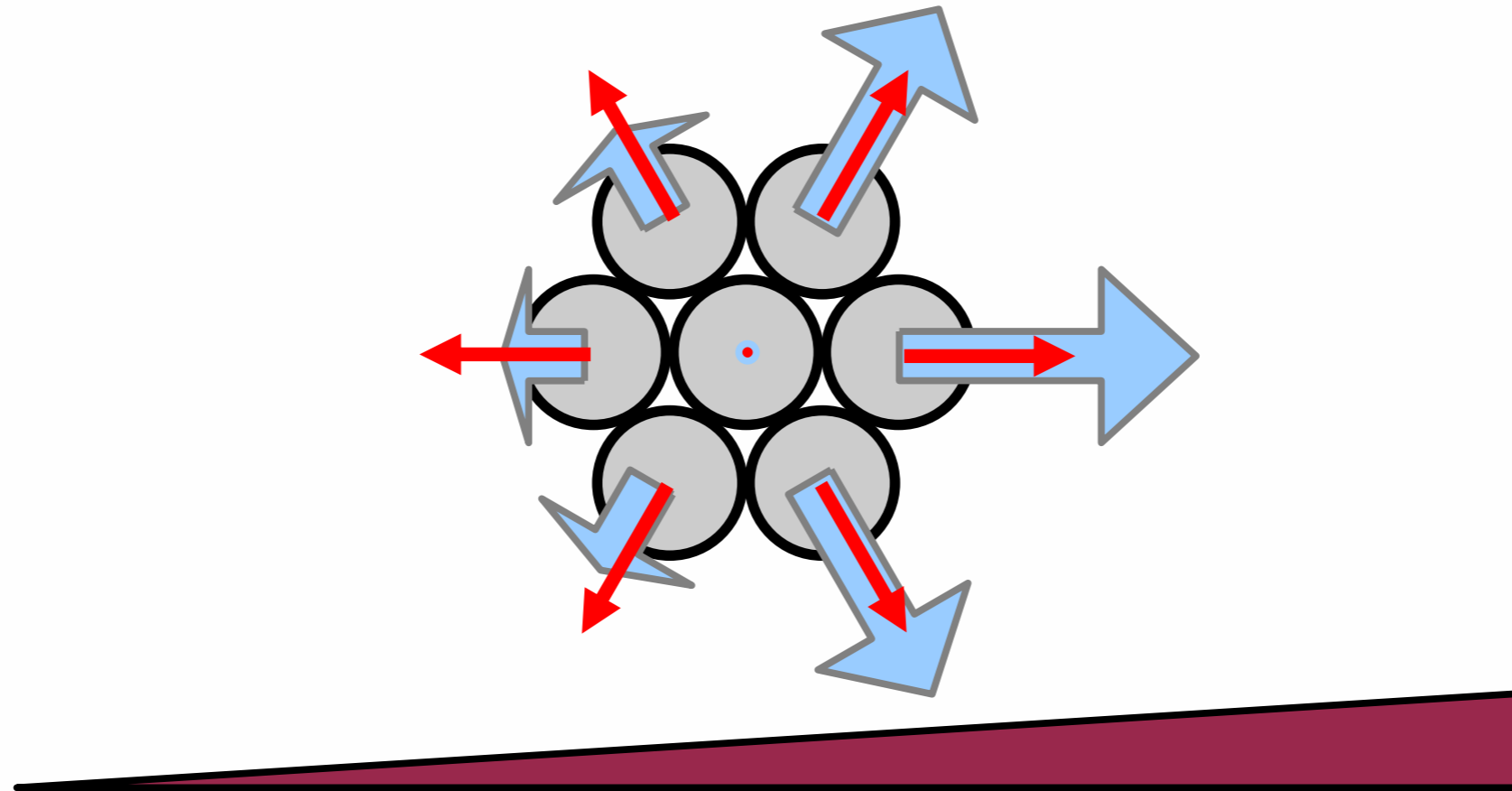
Single cells are random walkers

# Stochastic particle model



Cells want to move away from their neighbors (CIL) but are stuck together mechanically

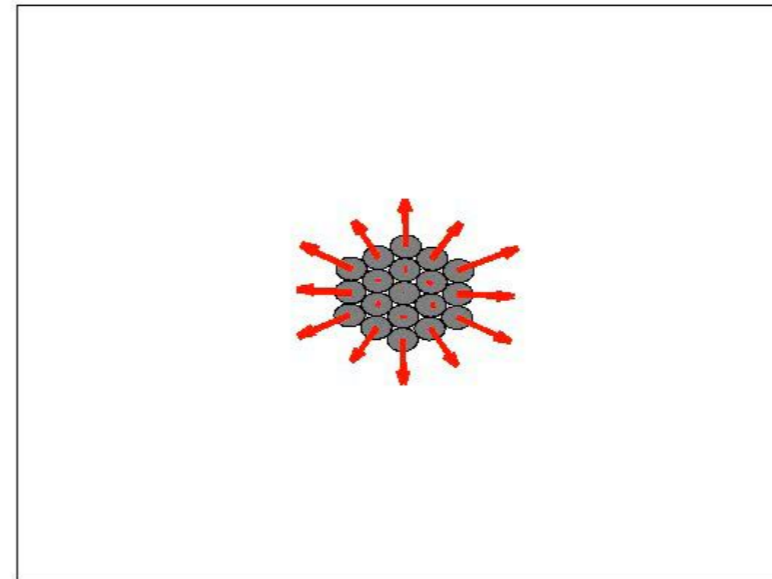
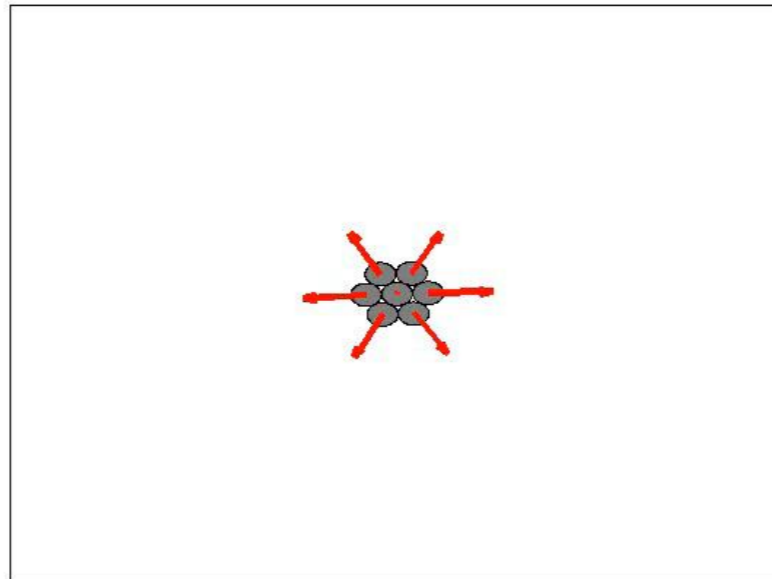
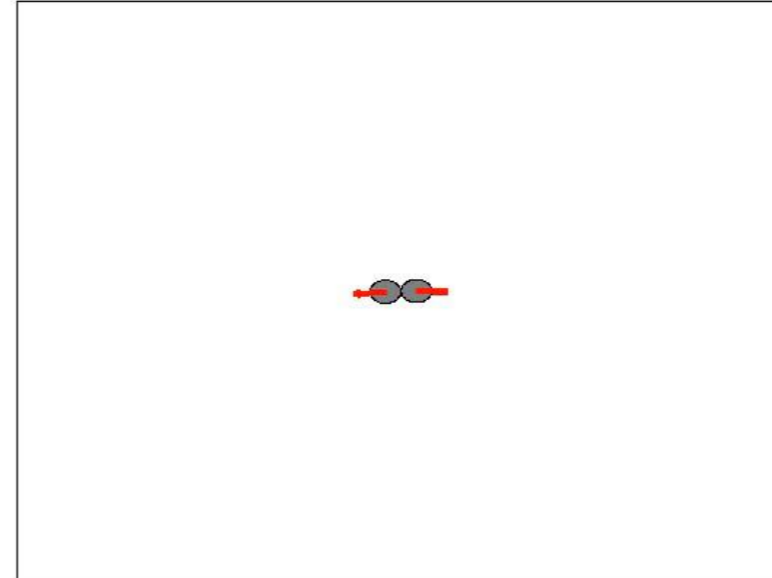
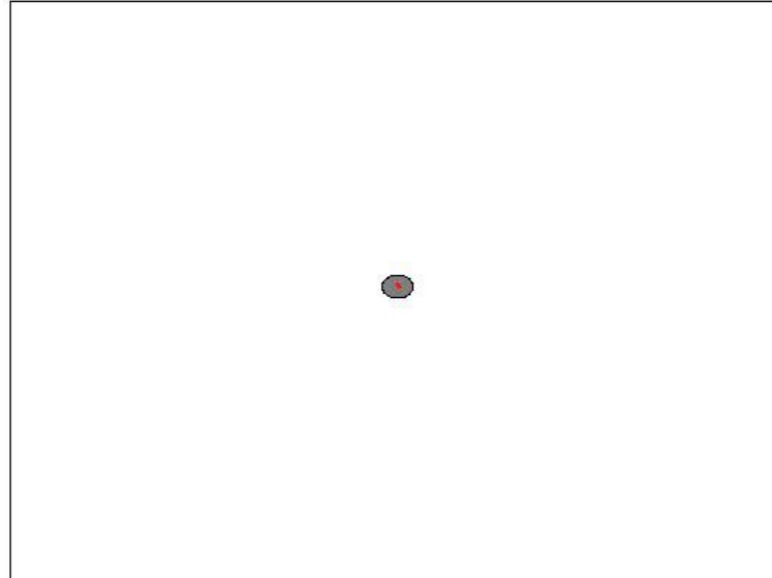
# Stochastic particle model



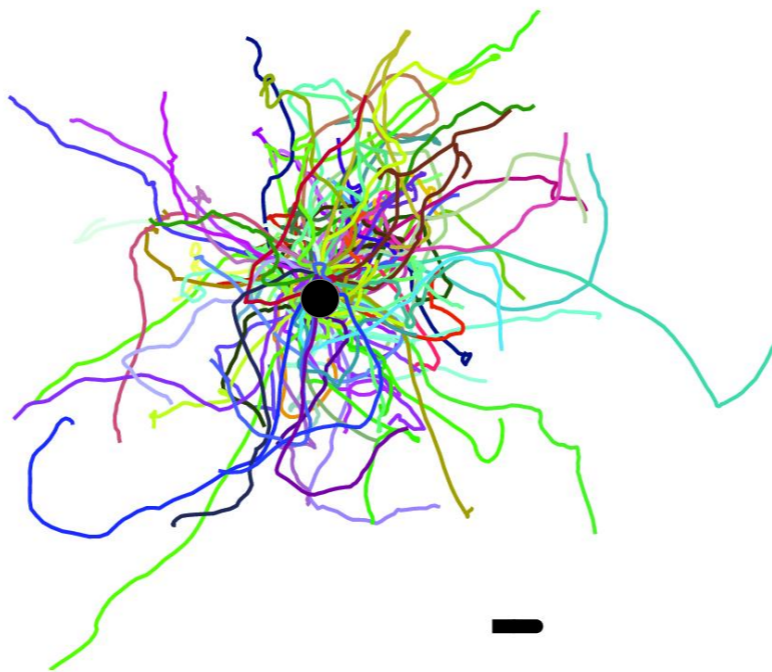
Signal  $S(r)$

Cells feel CIL more strongly when  
the signal is large

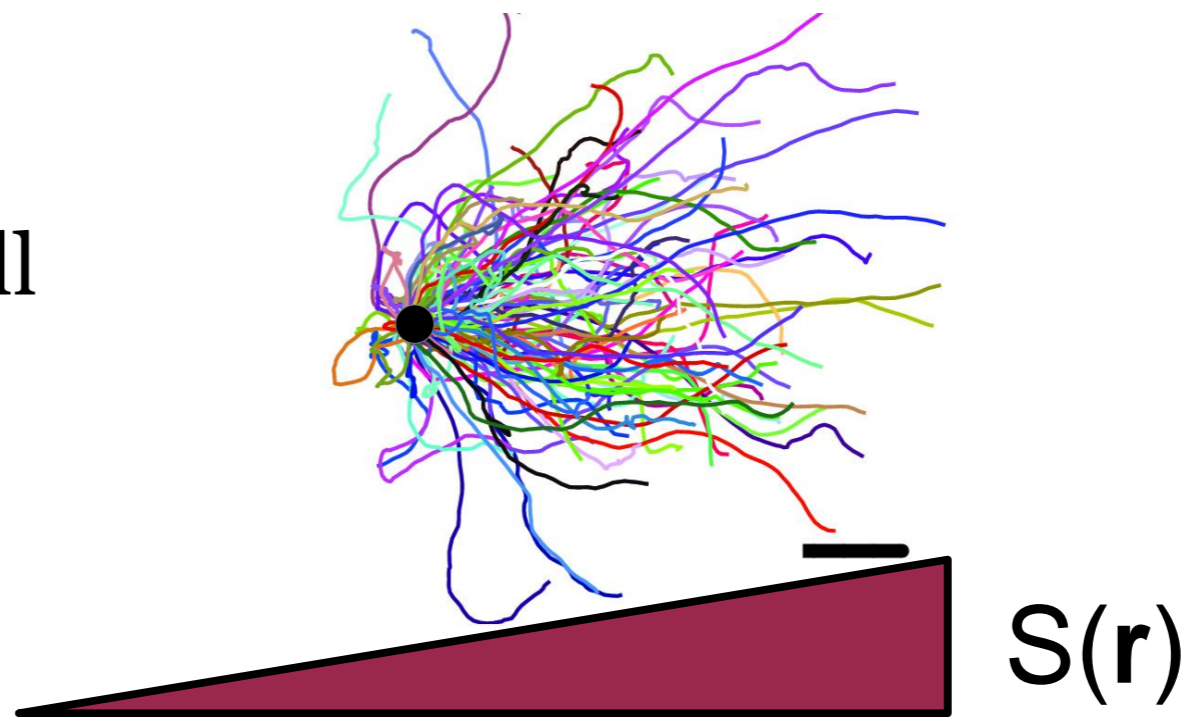
# Simulations of the model




Single cells



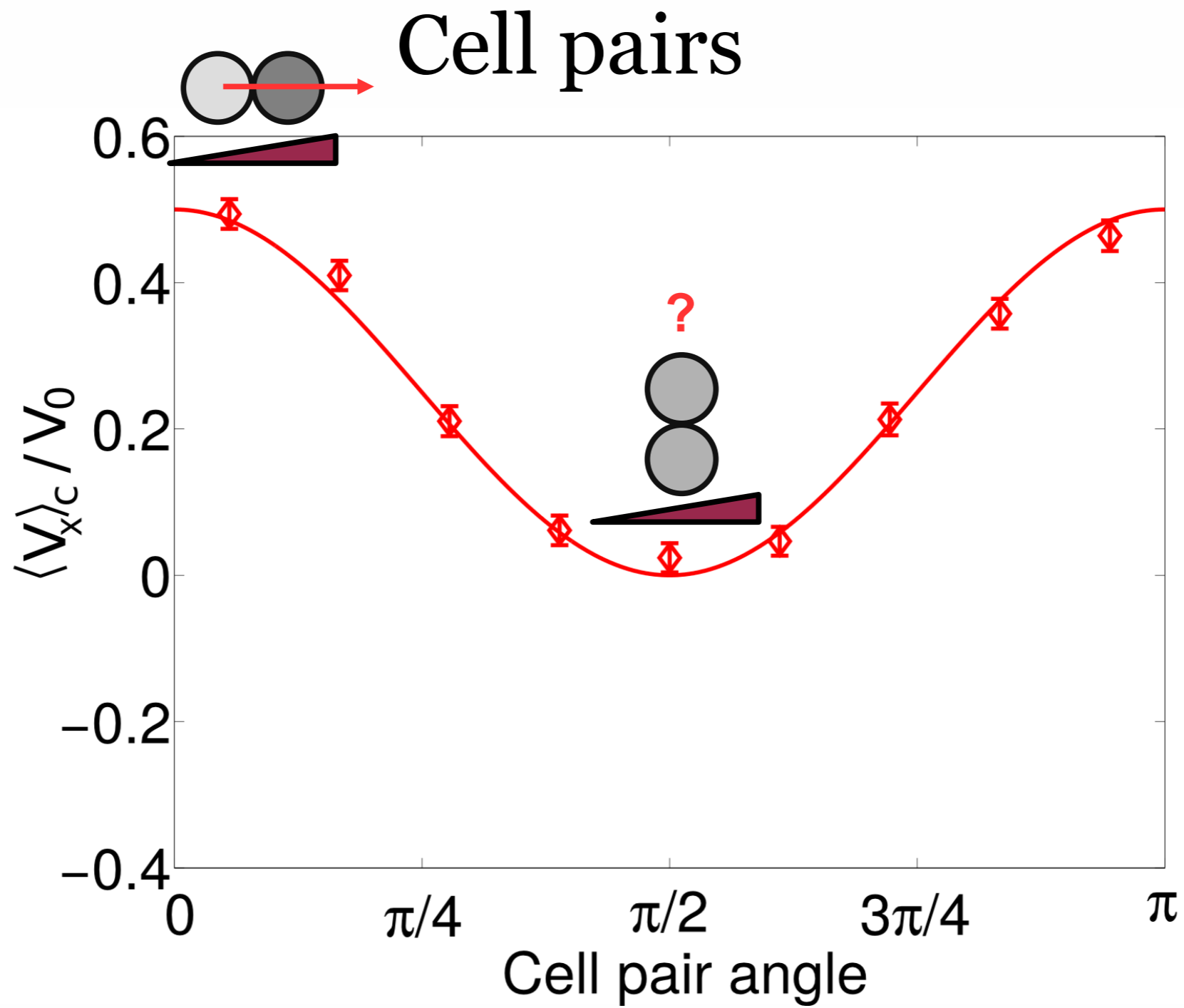
Seven-cell clusters



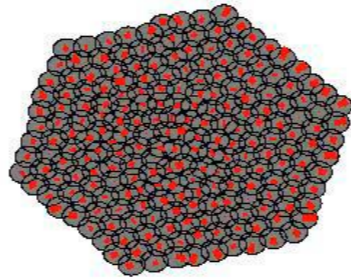


How can we tell if a cluster is using  
collective guidance?

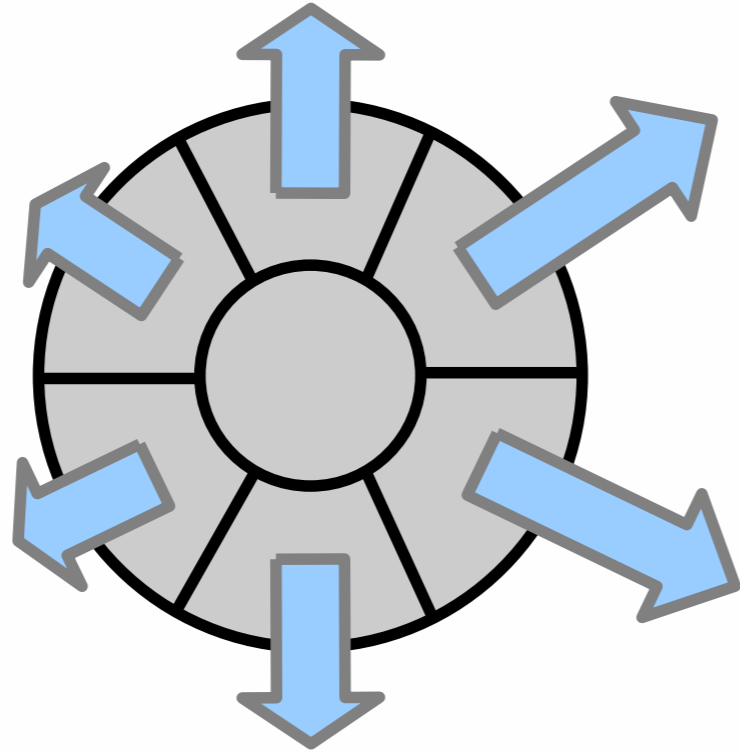




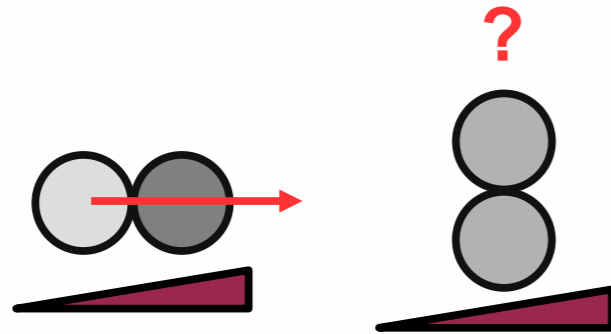
What if cells can't hold together?



# Conclusions

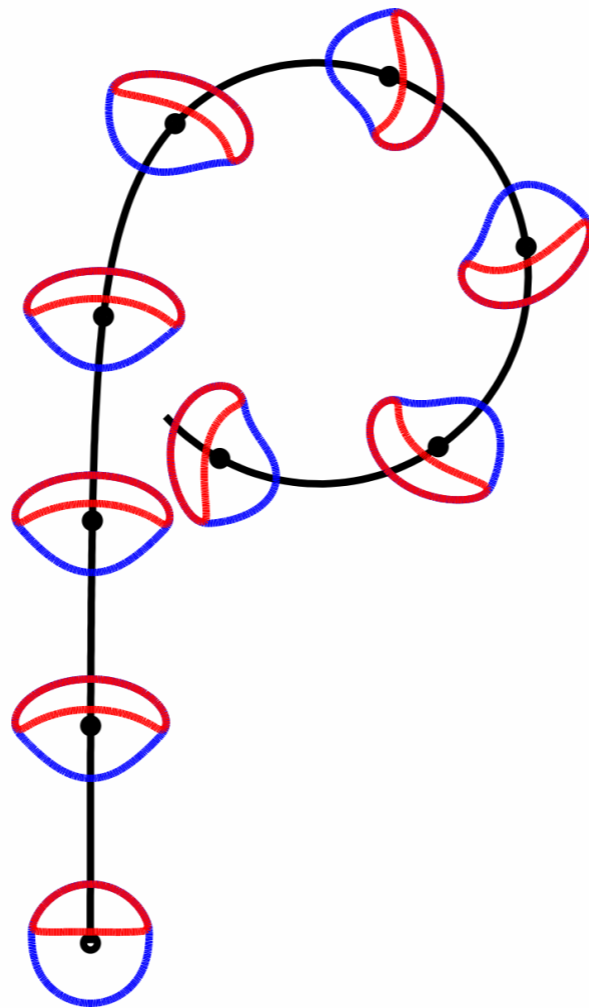


Cell clusters can have abilities that single cells don't!

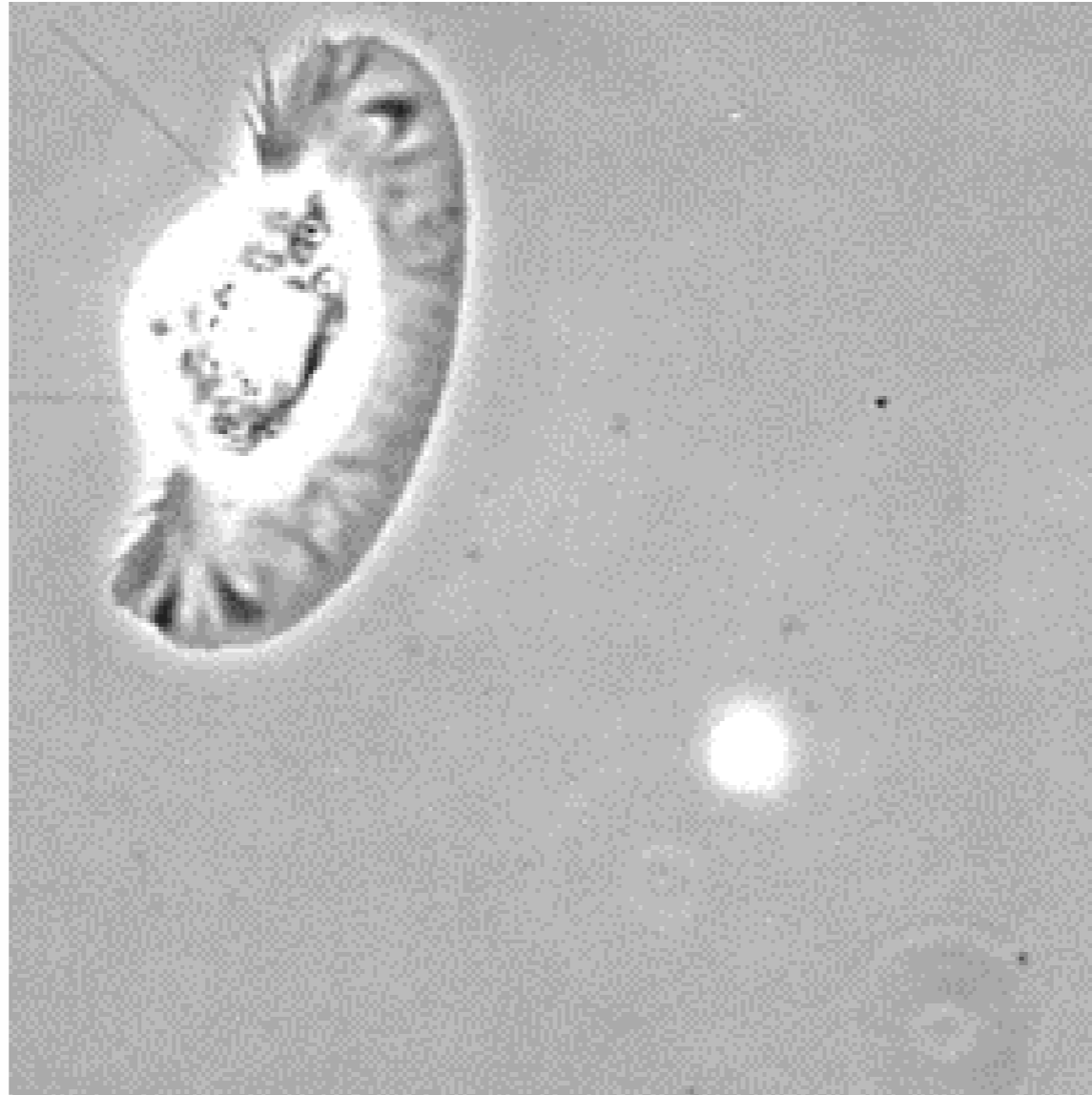


We can determine why by looking at cell pairs at different angles

# Story 2: Circulating Cells, or How Water Droplets Create Rotation

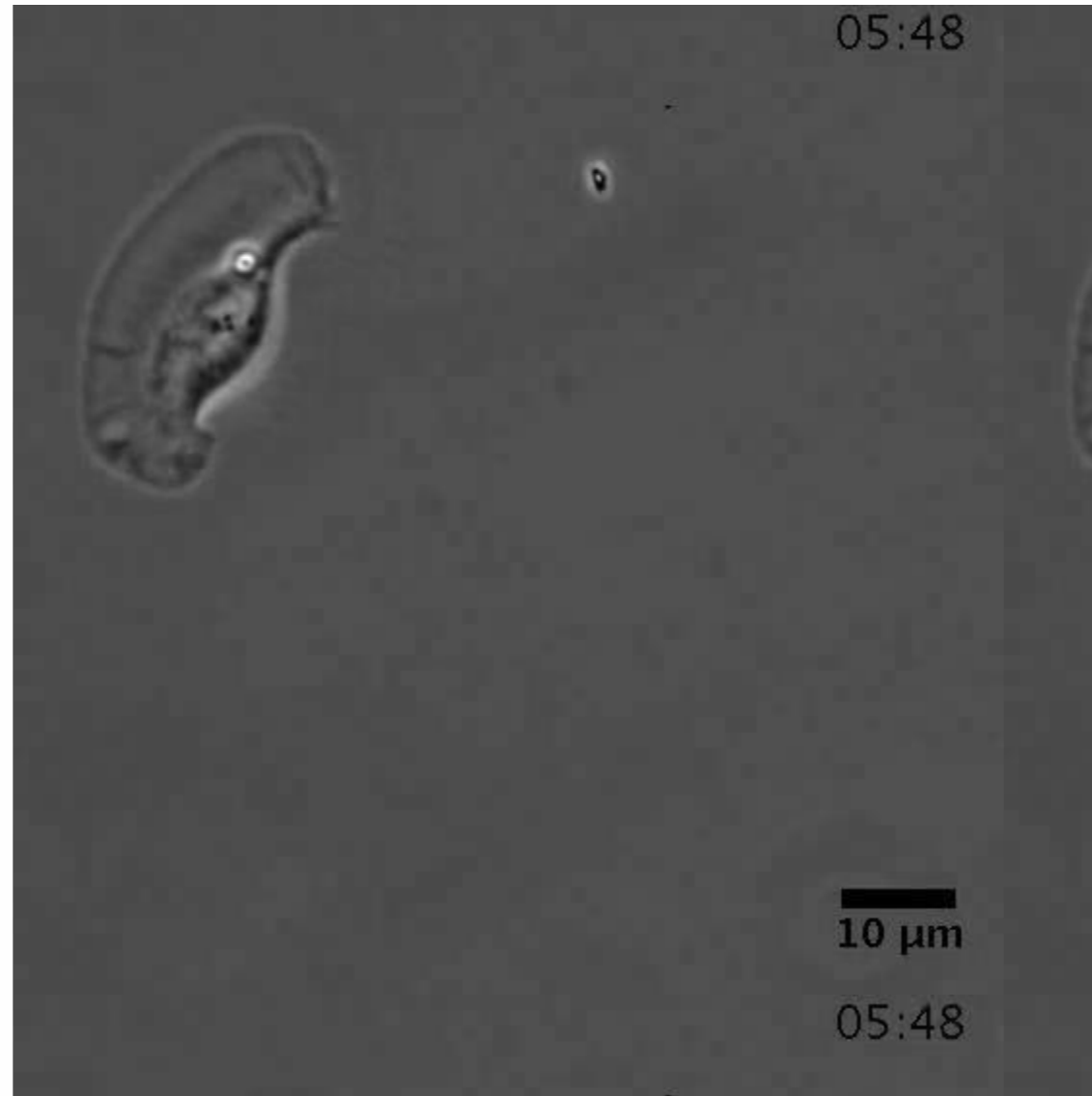


Eukaryotic cells typically crawl with a (persistent) random walk



Barnhart.... Theriot, Biophys. J.  
2010

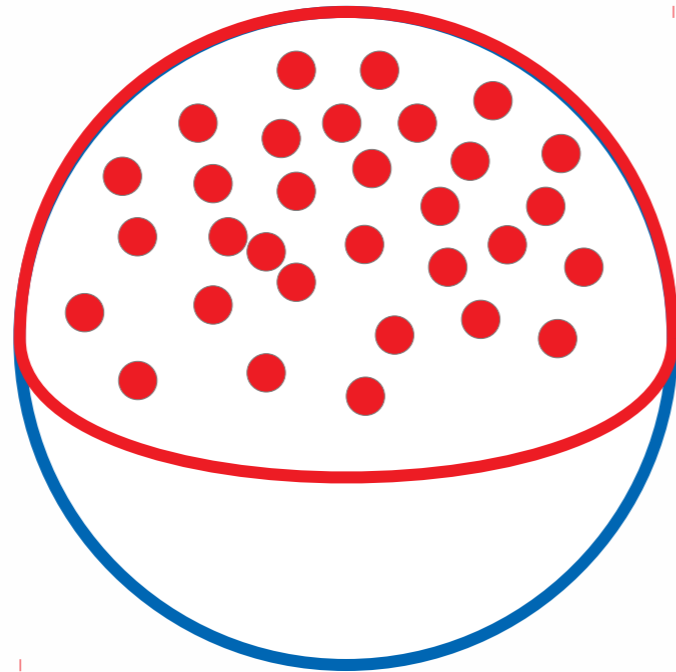
# A surprise!



Allen... Theriot, Mogilner, Cell Systems 2020

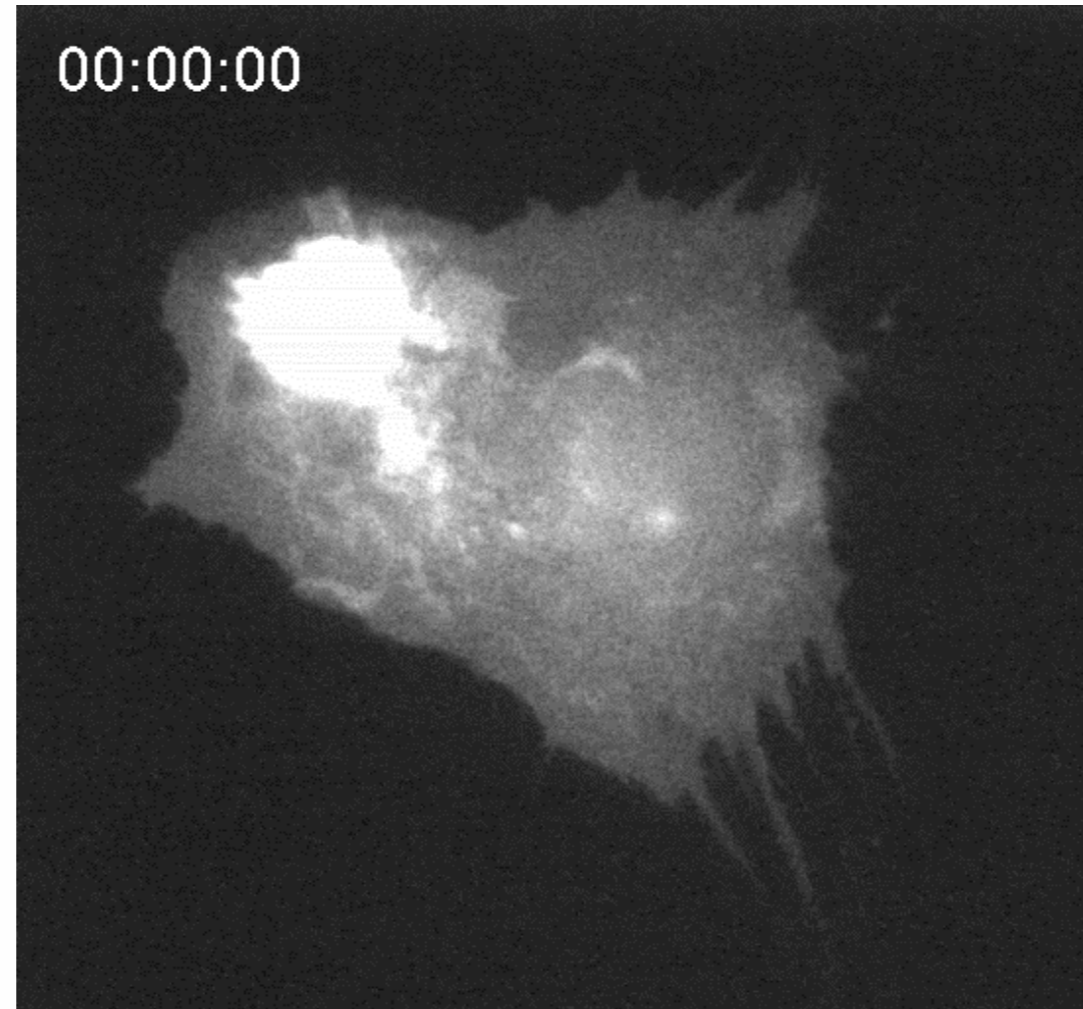
# Cell polarity: what is the front?

Deliberately oversimple view:



There are more proteins of certain types at the front!

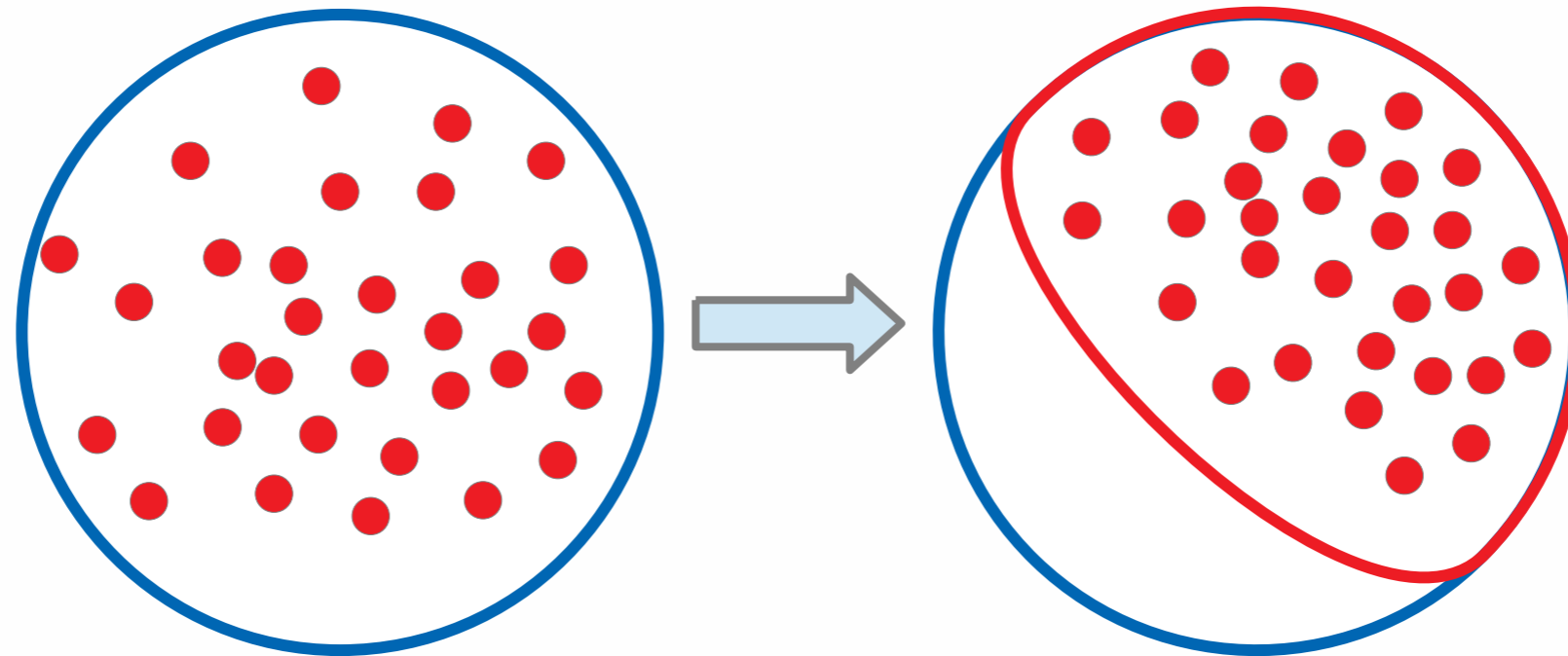
(Active) Rac is one of the proteins that defines the cell front



Rac activation by light, Wu...  
Hahn, Nature 2009



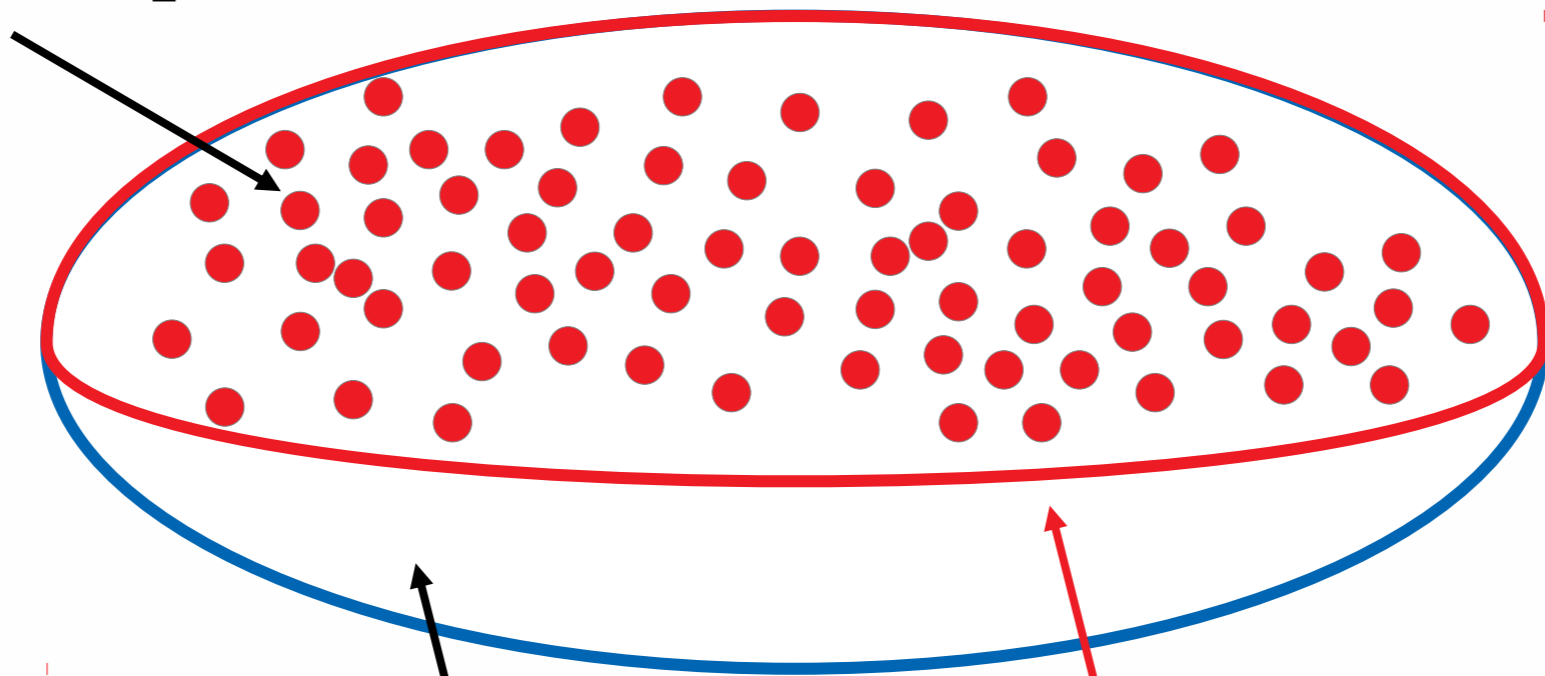
Even if there is no signal, the cell will pick a front randomly



Think (not quite right): proteins like to clump together

# What if cell isn't circular?

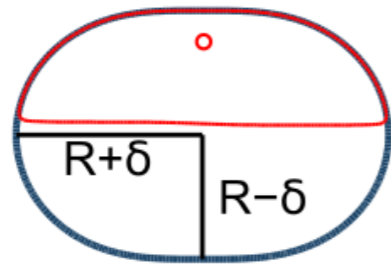
Like droplet of water



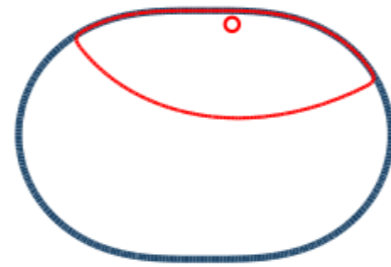
Like vacuum

Surface tension on  
this interface!

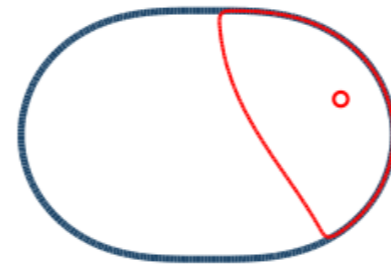
# The interface of the high-protein area should be minimized!



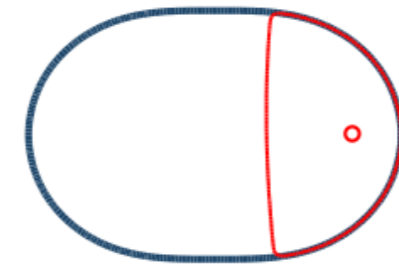
$t = 0.2$



$t = 16.2$

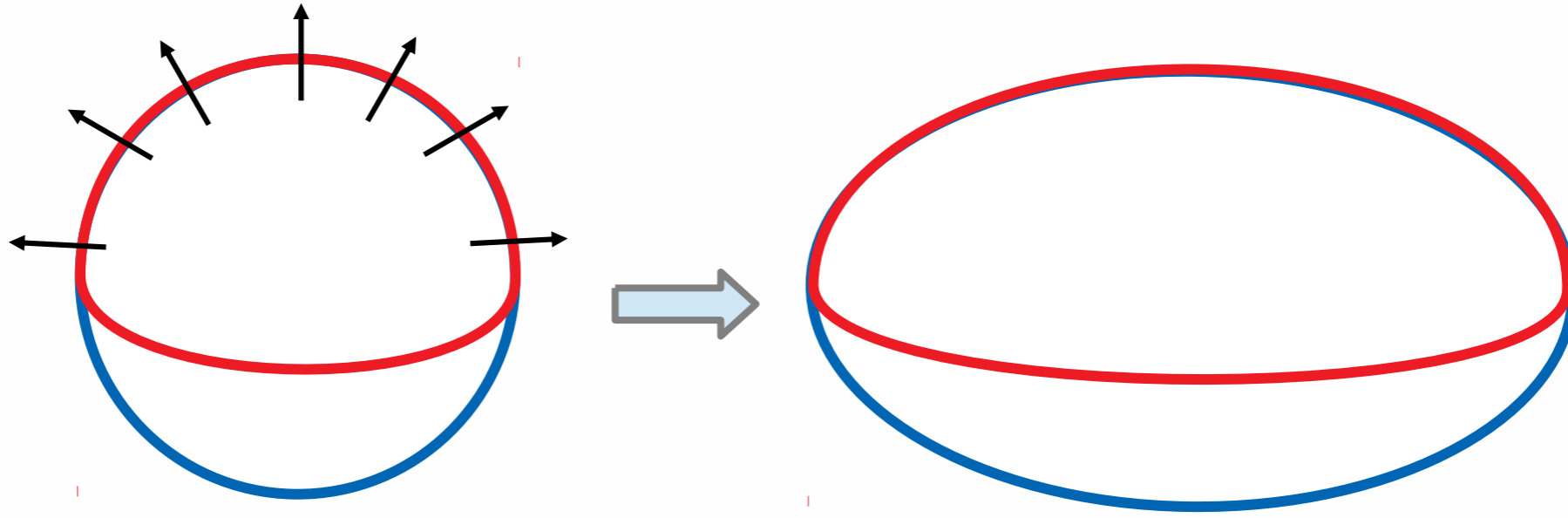


$t = 32.2$



$t = 48.2$

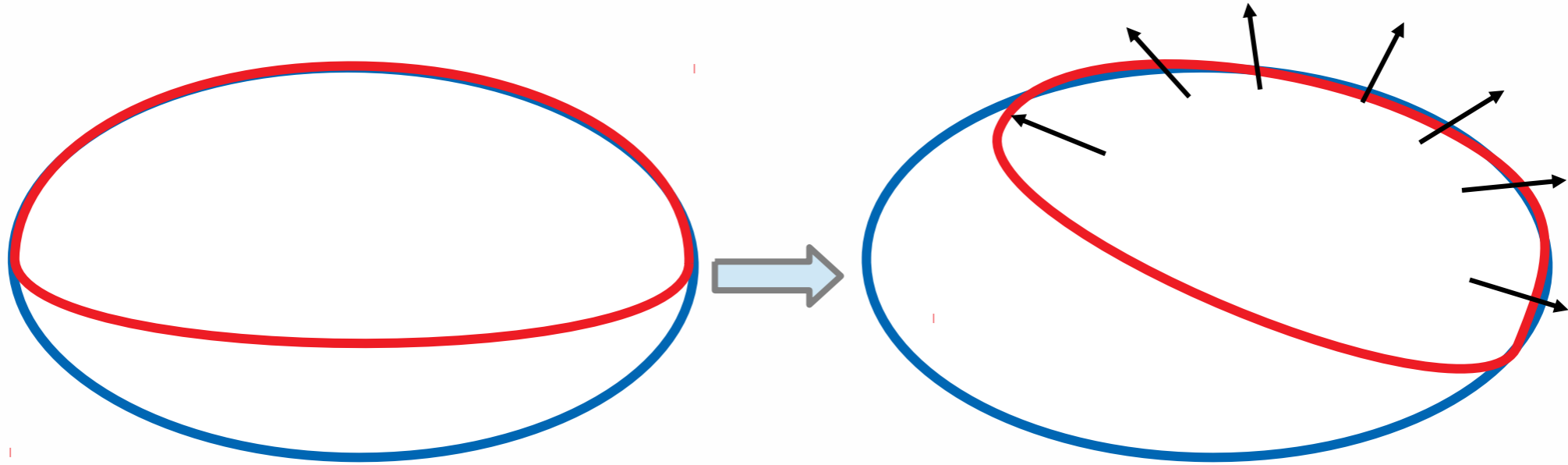
# Now we can understand turning!



Cell pushes forward  
where Rac is high

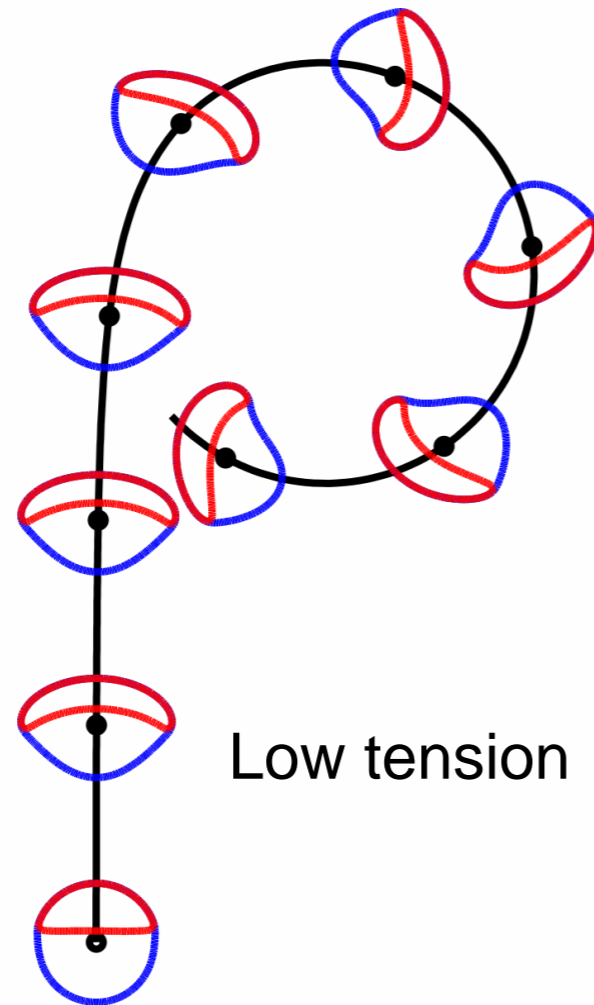
Cell becomes elongated

# Now we can understand turning!

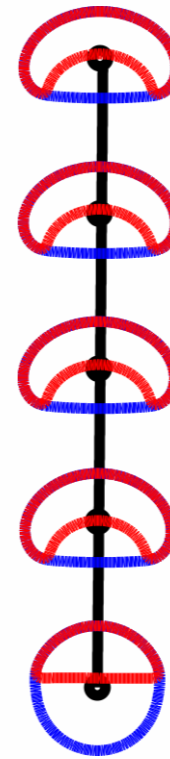


Rac reorients to minimize  
interface length

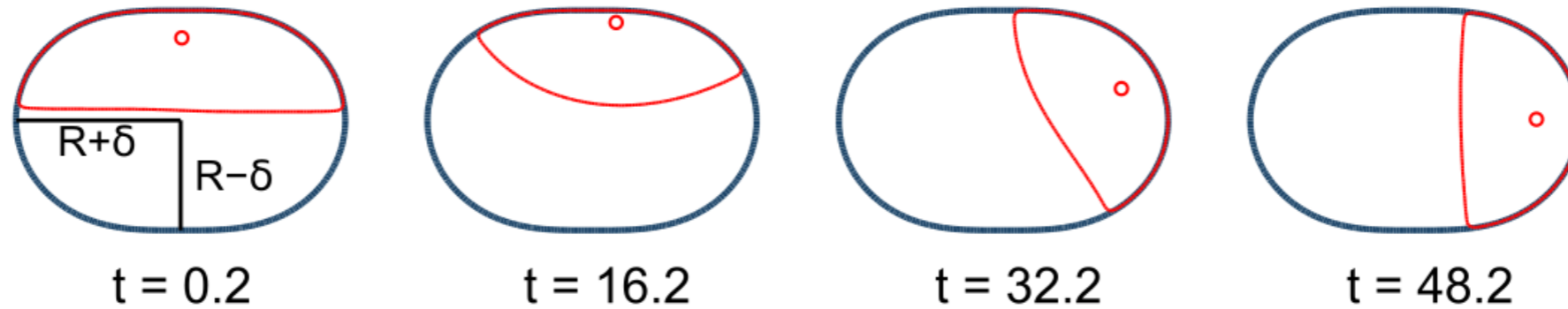
# Turning happens if the cell shape is sufficiently deformable



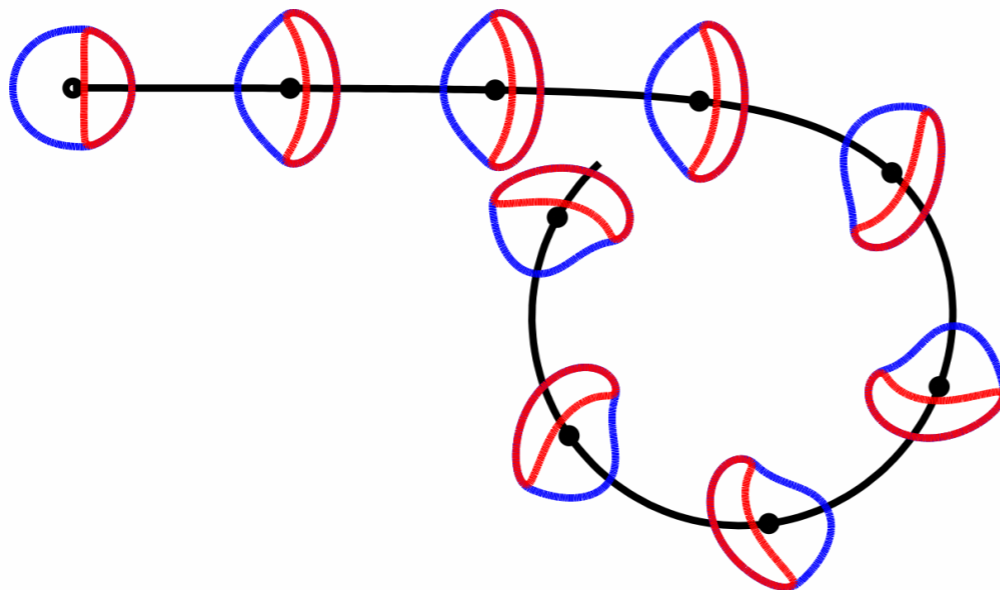
High tension



# Conclusions



Cell shape and the reactions within it are coupled, in part because high  $Rac$  areas are like a water droplet



This suggests turning will happen if cell shape is deformable enough

# Bonus results on patterning!

“Sensing the shape of a cell with reaction-diffusion and energy minimization”  
Singh, Leadbetter, Camley arXiv:2111.08496 (2021)  
In press at PNAS 2022



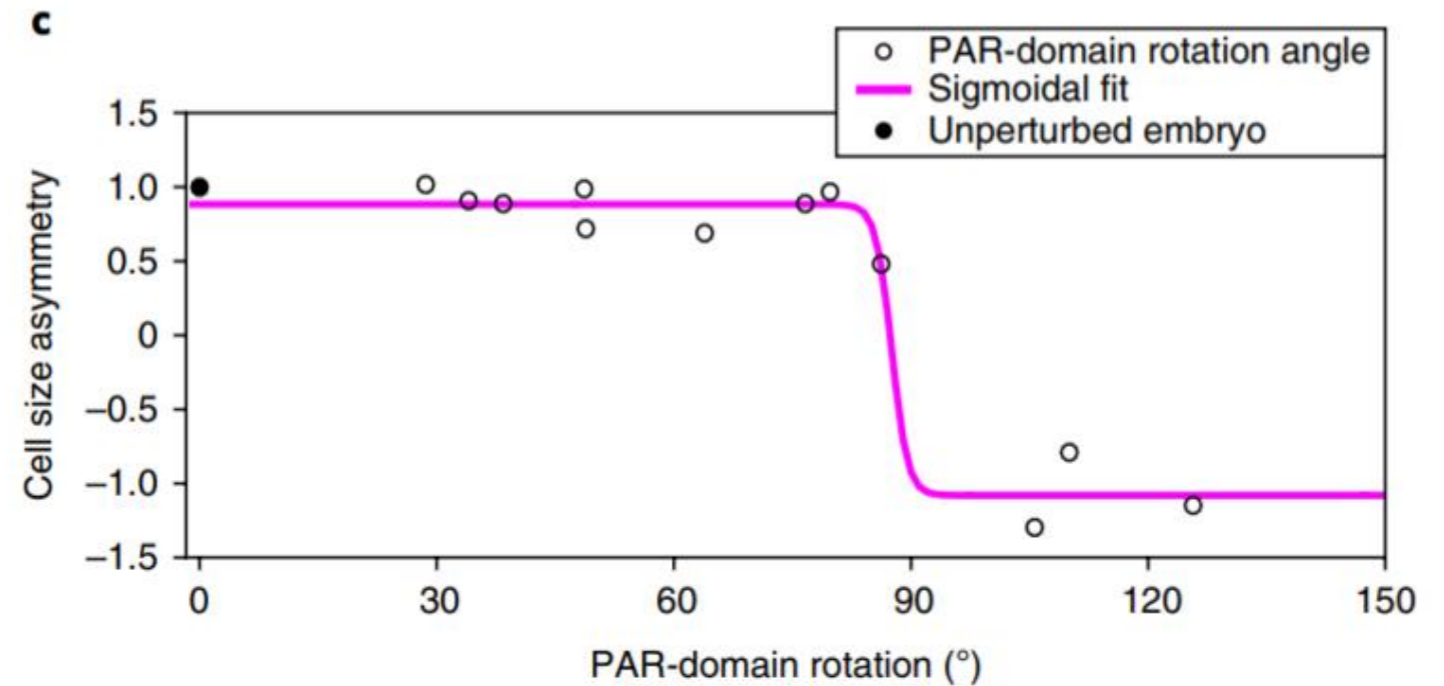
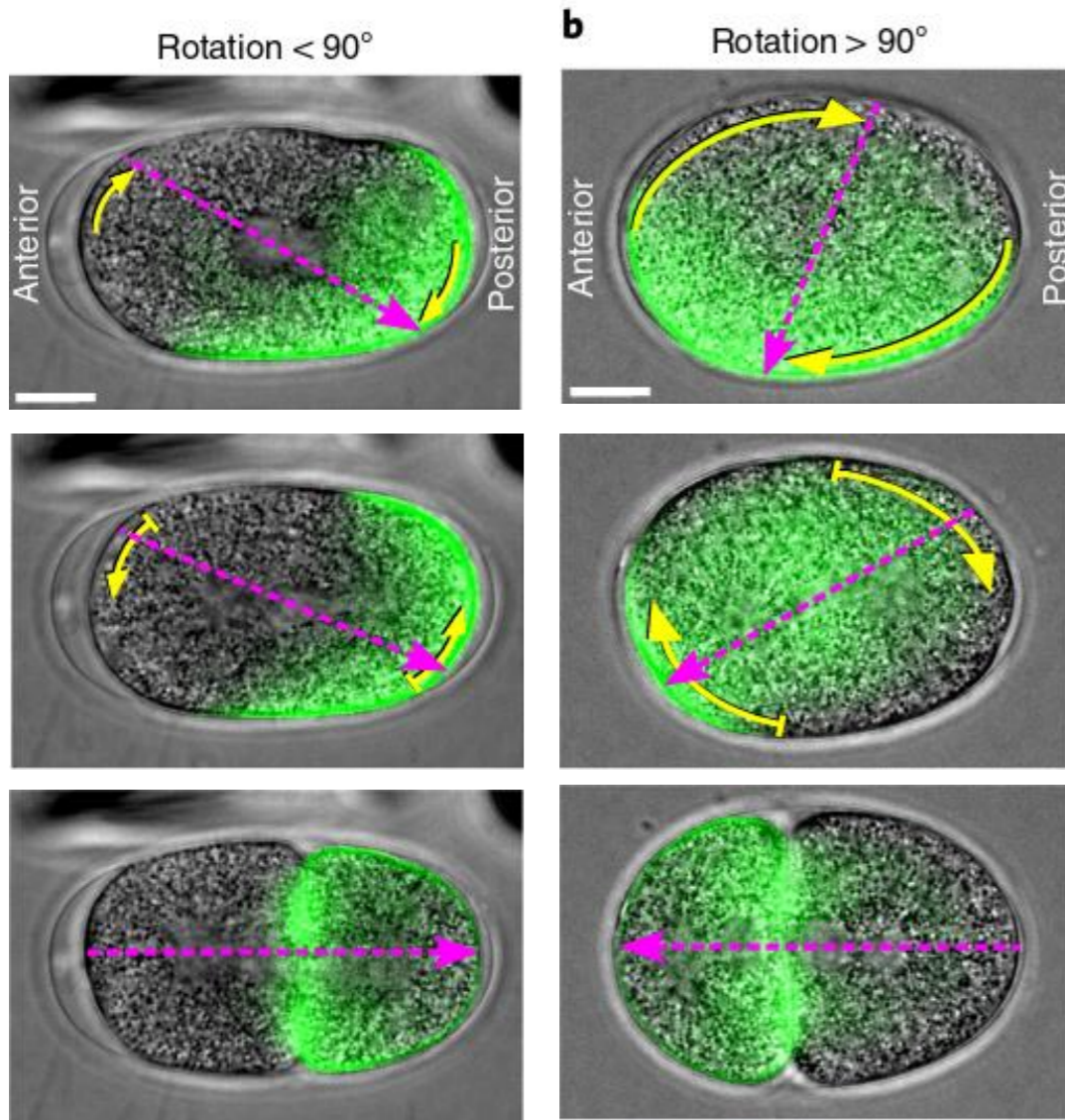
# Sensing the long axis in development?

C elegans zygote:



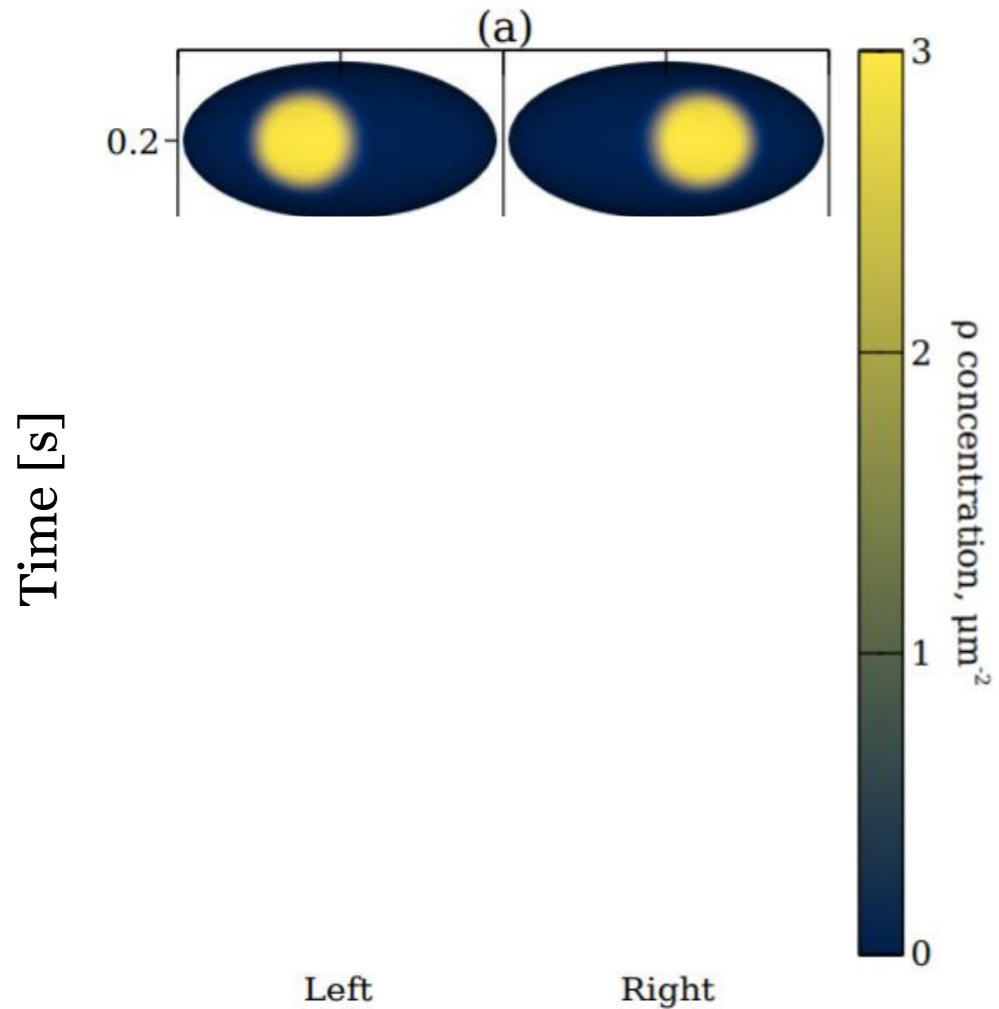
PAR-2 protein  
(drives asymmetric  
division)

# Sensing the long axis in development?



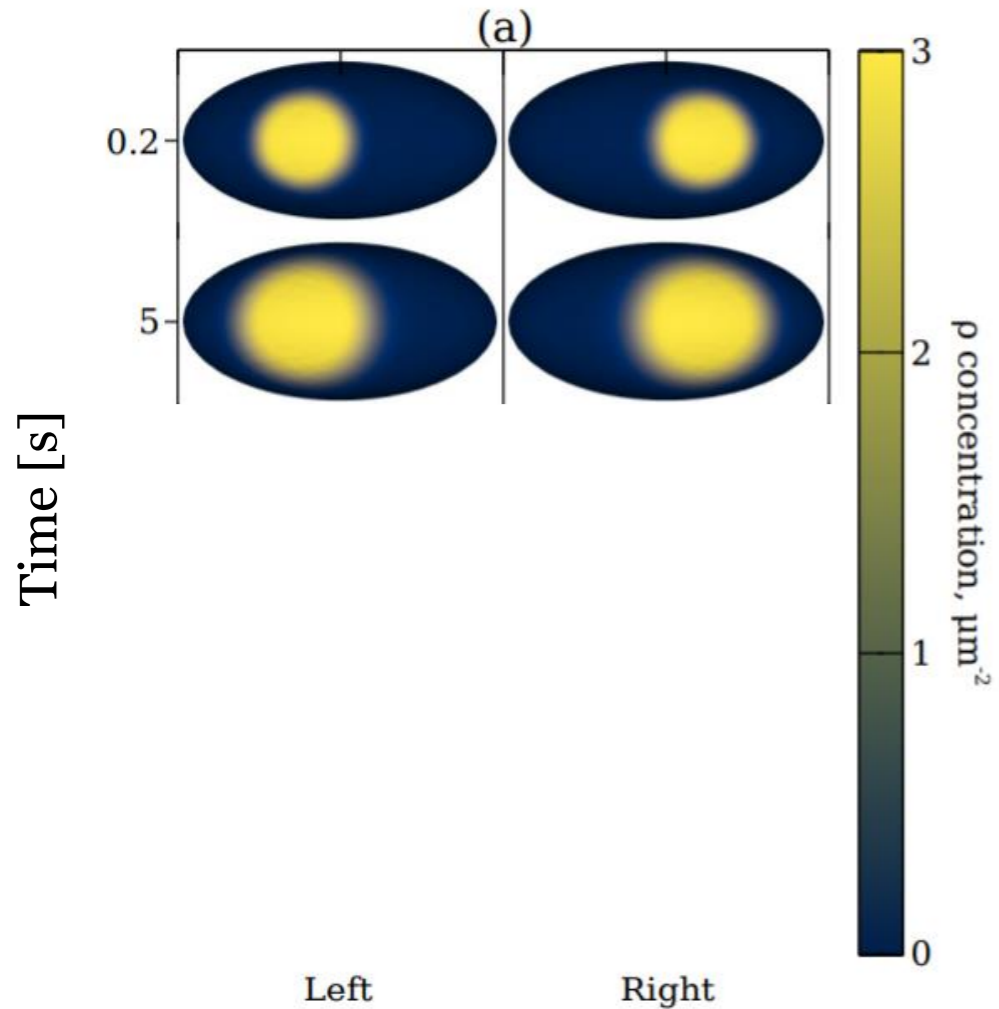
Mittasch, M., et al (2018). Non-invasive perturbations of intracellular flow reveal physical principles of cell organization. *Nature Cell Biology*, 20(3), 344–351.

# Minimal model senses the long axis!



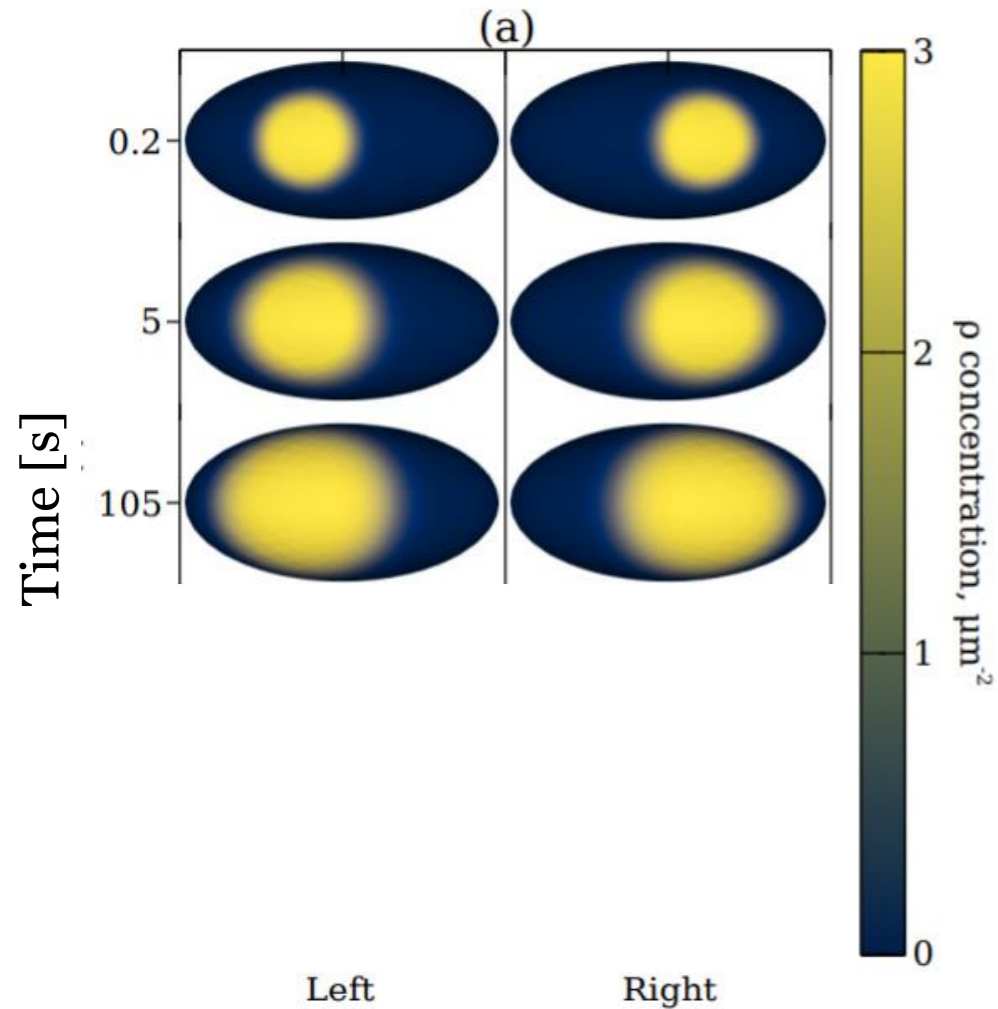
Simulating the minimal cell polarity model

# Minimal model senses the long axis!



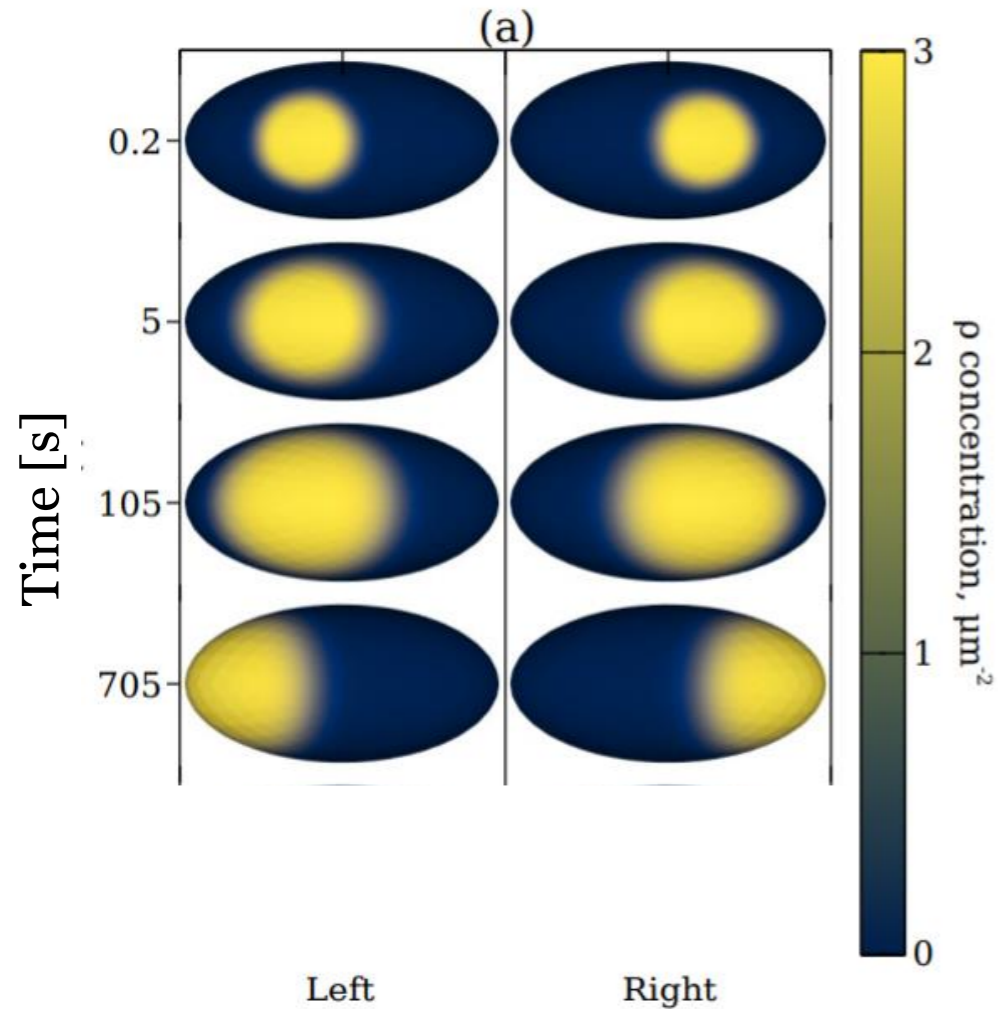
Simulating the minimal cell polarity model

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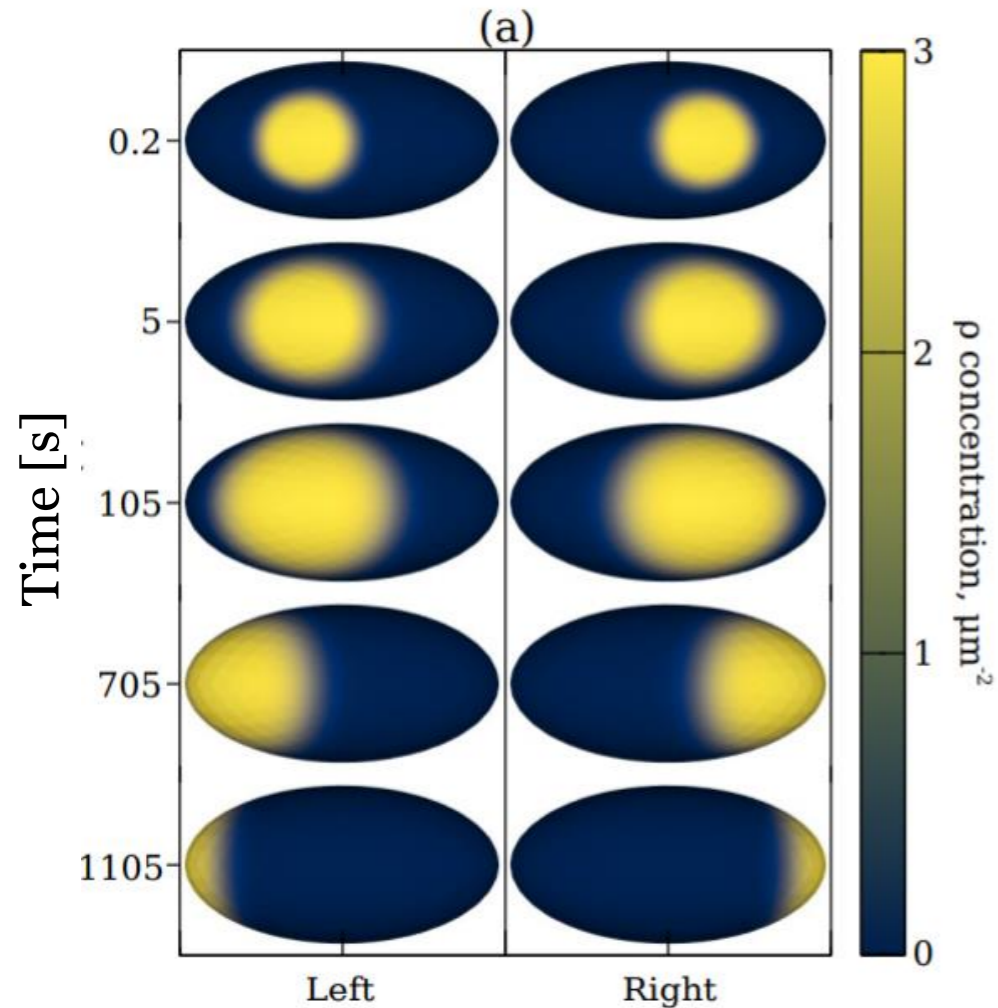
Simulating the minimal cell polarity model

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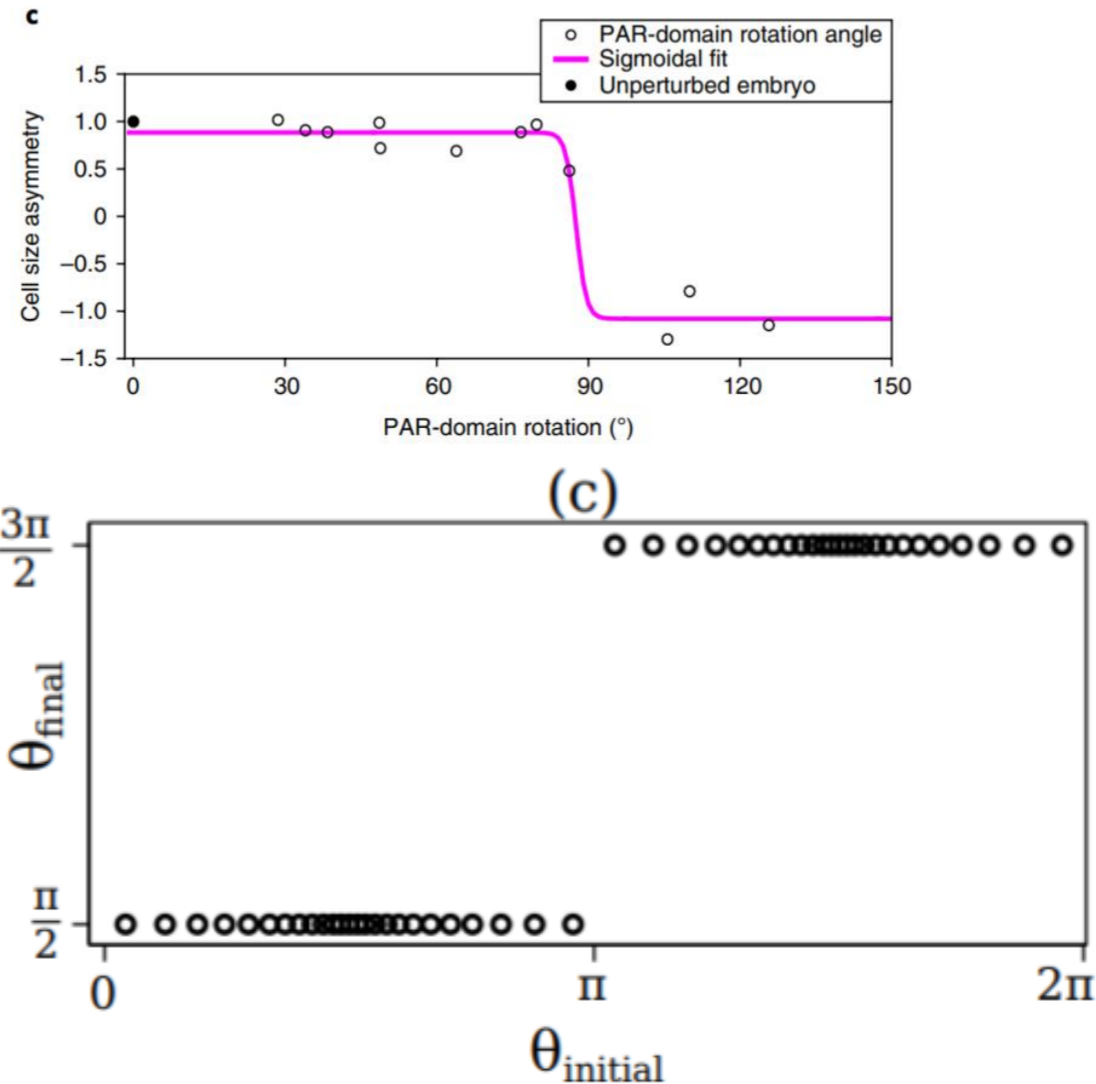
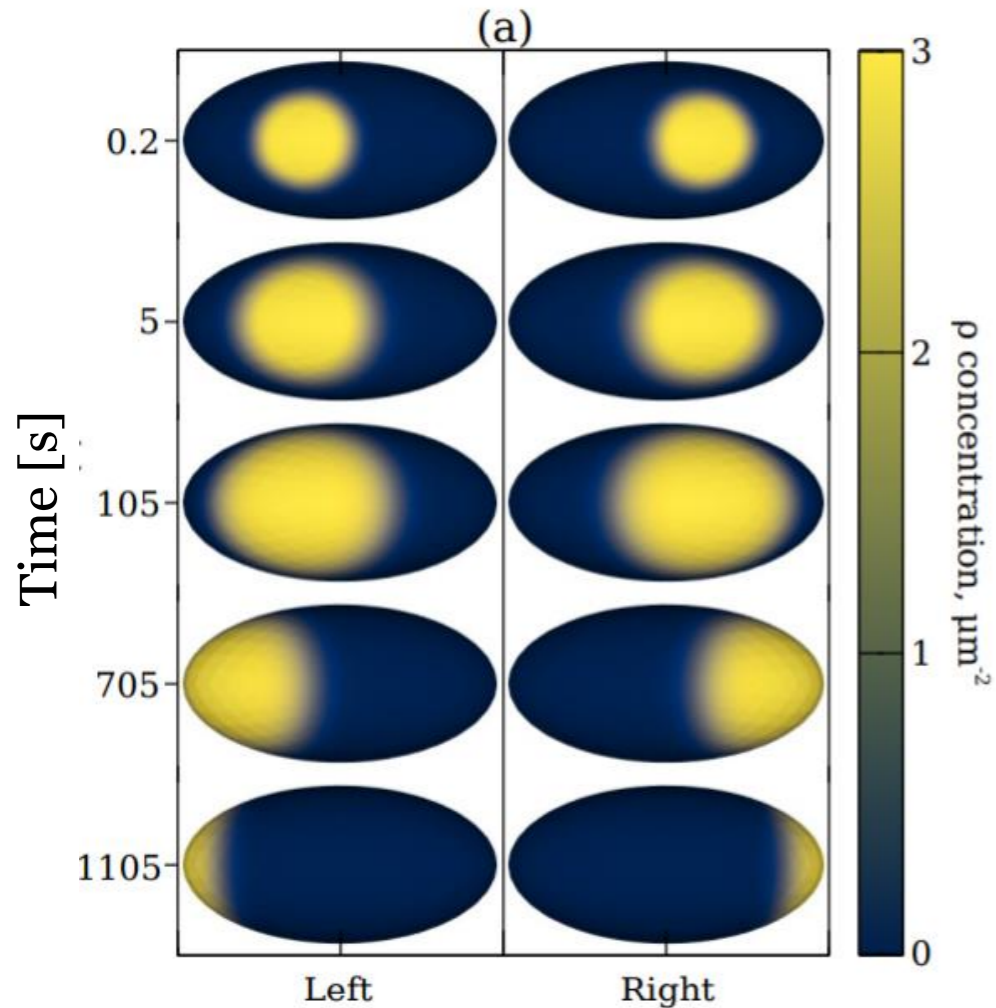
Simulating the minimal cell polarity model

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Simulating the minimal cell polarity model

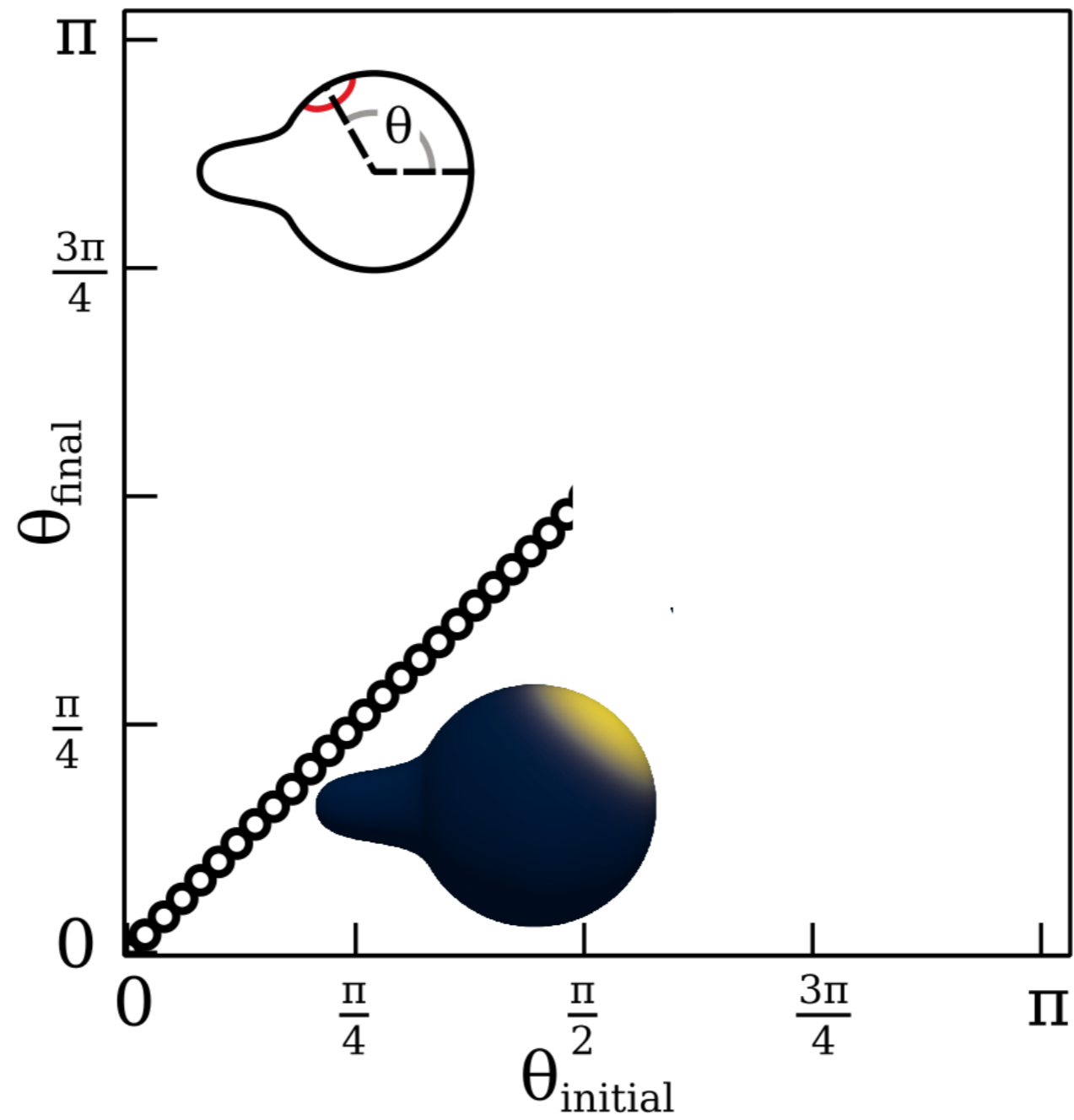
# Minimal model senses the long axis!

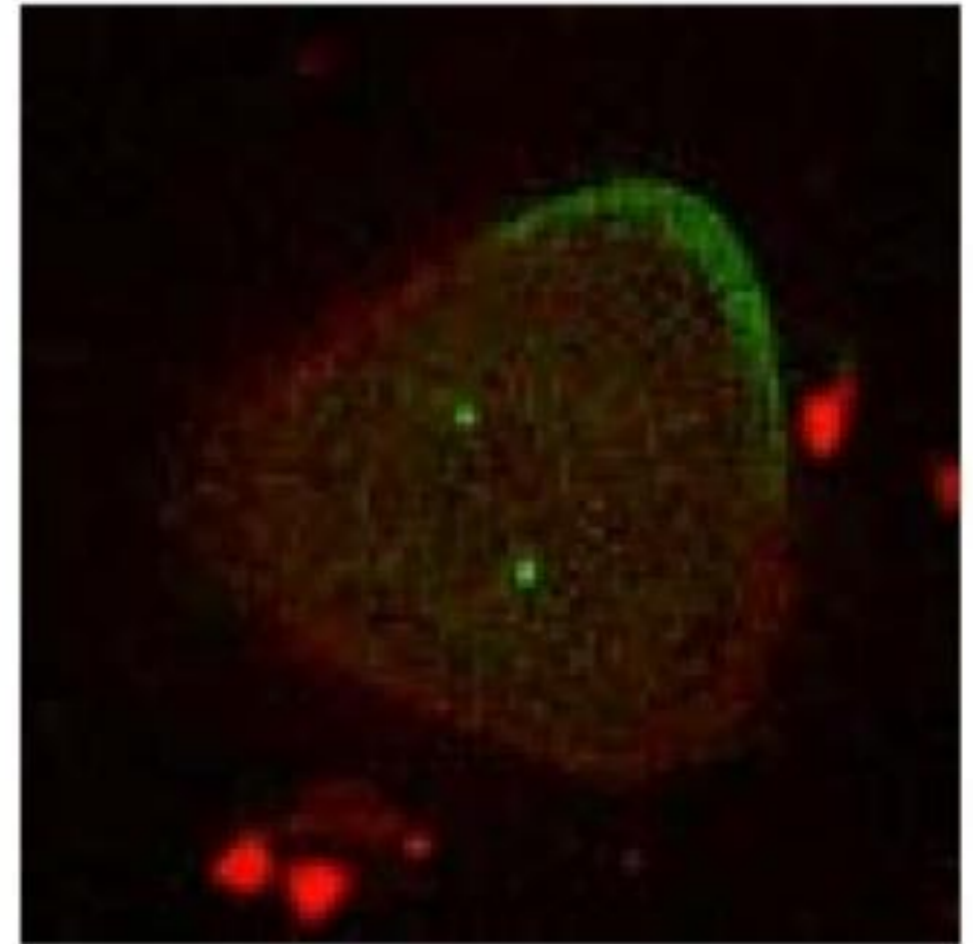
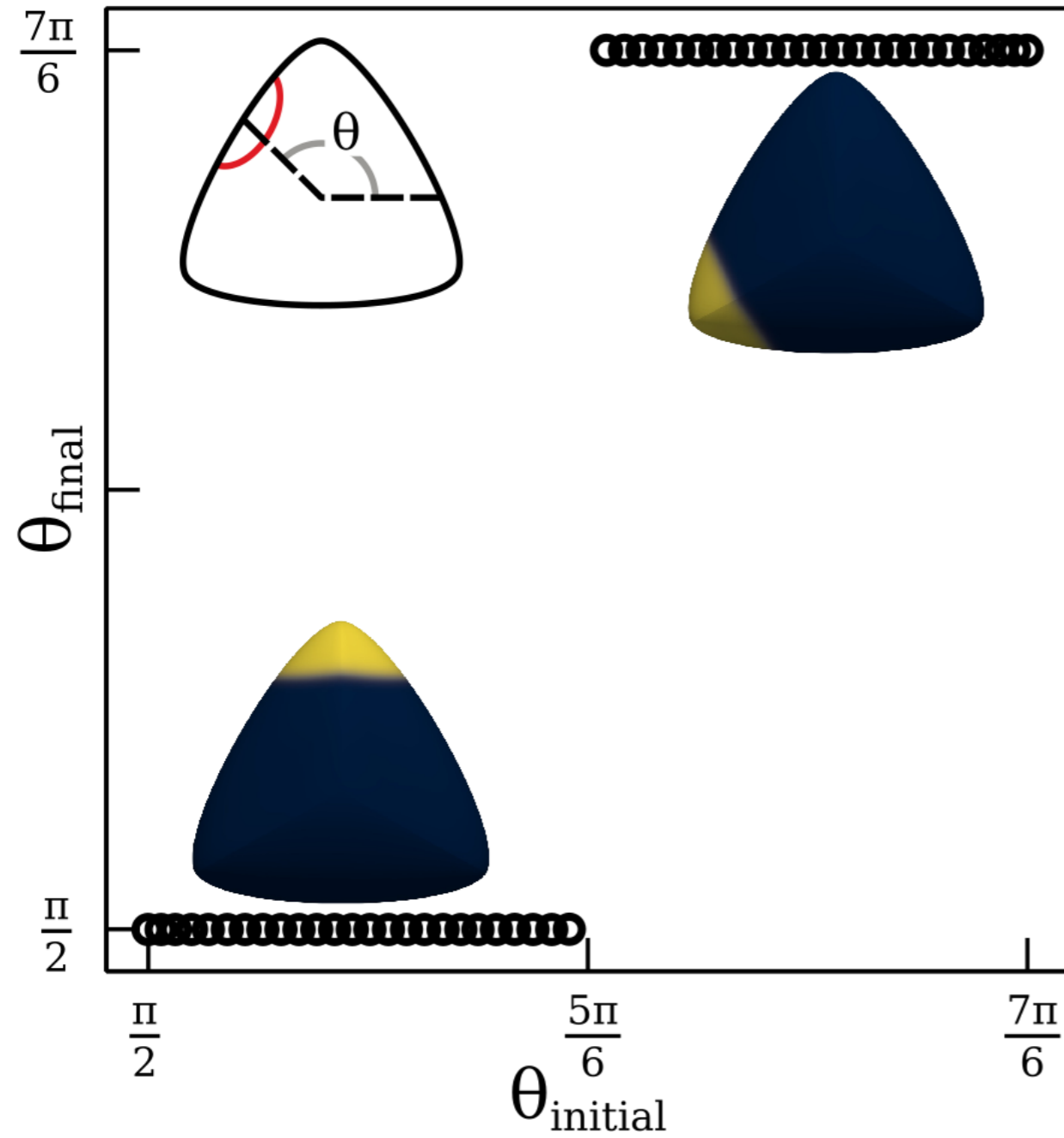


Simulating the minimal cell polarity model

Caveats: far more to the PAR system than a single protein







Klinkert et al... Gönczy eLife  
 2019

# Acknowledgments

Later work done with Amit Singh, Travis  
Leadbetter  
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