

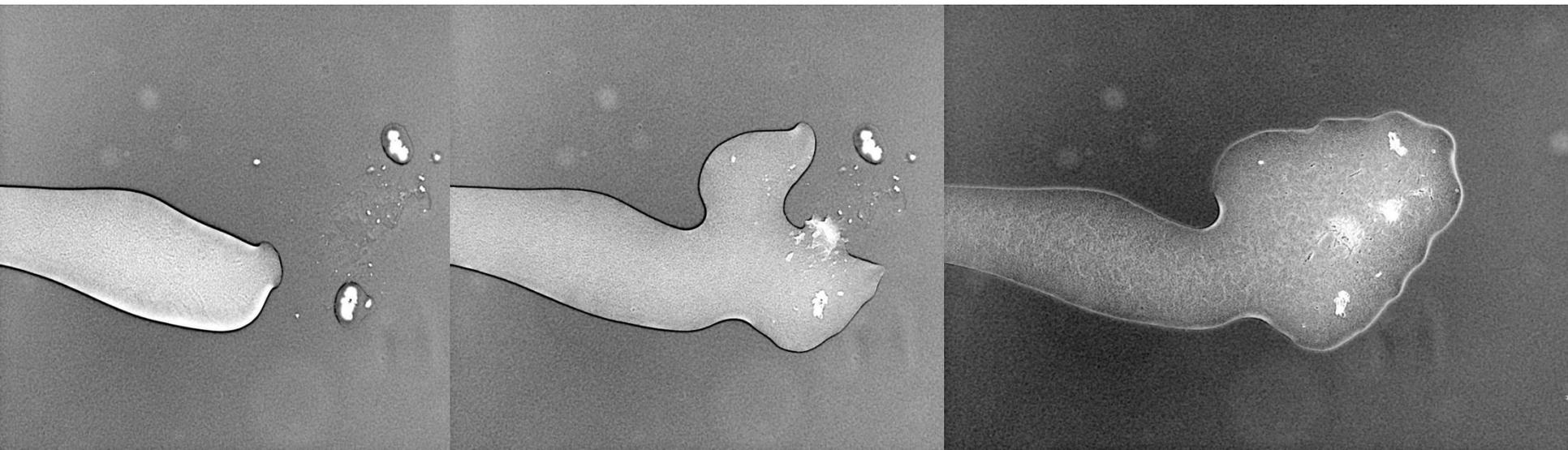
# Bacterial collective swarming and navigation

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in collaboration with

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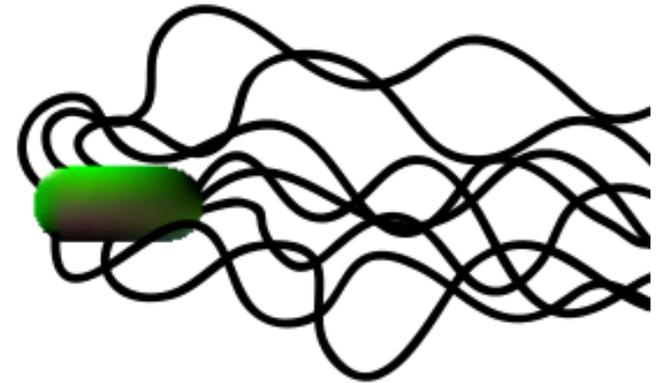
Colin Ingham – Wageningen University



# What is swarming of bacteria

[Kearns '10]

## A mode of motion



- Movement using flagella – mechanical motors.
- High density
- Above surfaces
- Extracellular matrix - hydration layer, surfactants.
- Approximately 2D

Swarming of *P. dendritiformis* by Avraham Be'er – Ben Gurion U

[movie](#) [with flow](#)

# Swarming as a selfish herd

Individuals benefit by being part of a group but otherwise compete

- **Minimally cooperation** - decide whether to swarm, quorum sensing, assessment of surfaces and nutrients
- **Competition on location** - occupy the colony periphery. Uncoordinated expansion.

[Darnton et al 10; Wu and Berg '12; Kearns '10...]

**Requires communication**

# Swarming as a selfish herd

## The dynamics inside a swarm

- Rapid mixing of cells
- Many length scales
- Chemotaxis – run and tumble

[Chen et al '12; Sokolov et al '07; Zhang et al '12]

# Swarming in coherent groups

Swarming of *P. vortex* – single branch  
streams with flow

# Swarming in coherent groups

Swarming of *P. vortex*

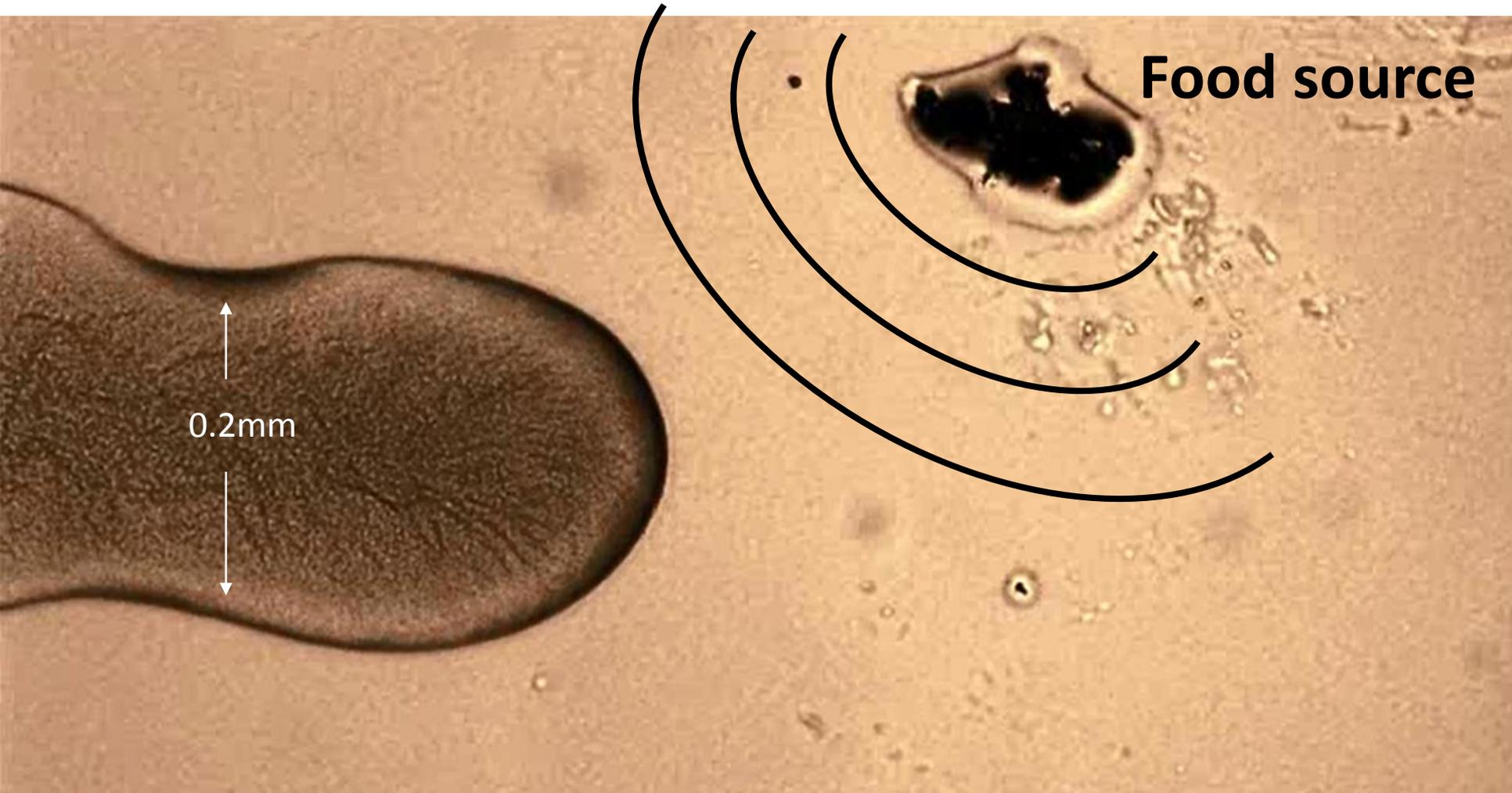
## Challenges the classical view of swarming

- Movement in organized groups
- Stable streams and vortices – traffic lanes
- Collective maneuvers
- Cooperation instead of competition
- Sharing of resources

[Ingham and Ben-Jacob '08; Ingham et al '11]

# Collective navigation

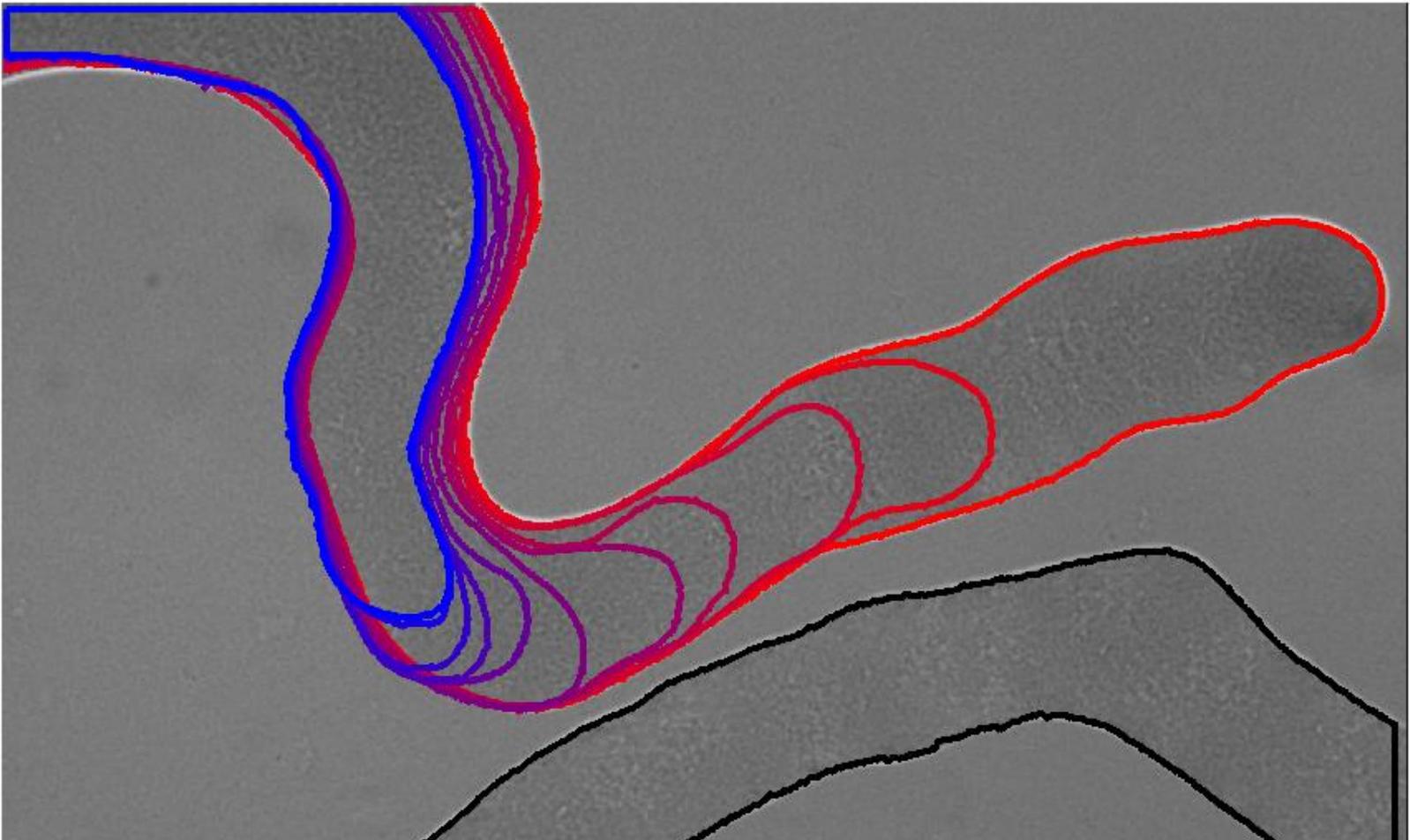
Navigation toward a source 1source 2sources



# Collective navigation

**Collision avoidance**

[movie](#)

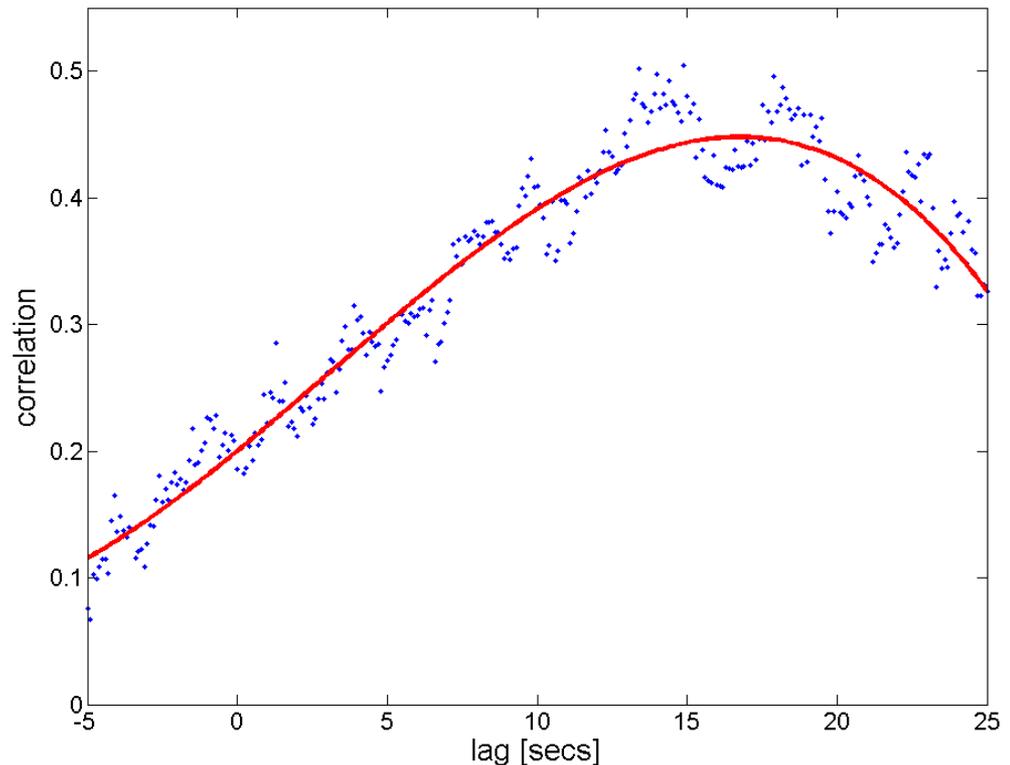


# Swarming in coherent groups

Collective navigation

Optical flow analysis:

The turning point predicts direction



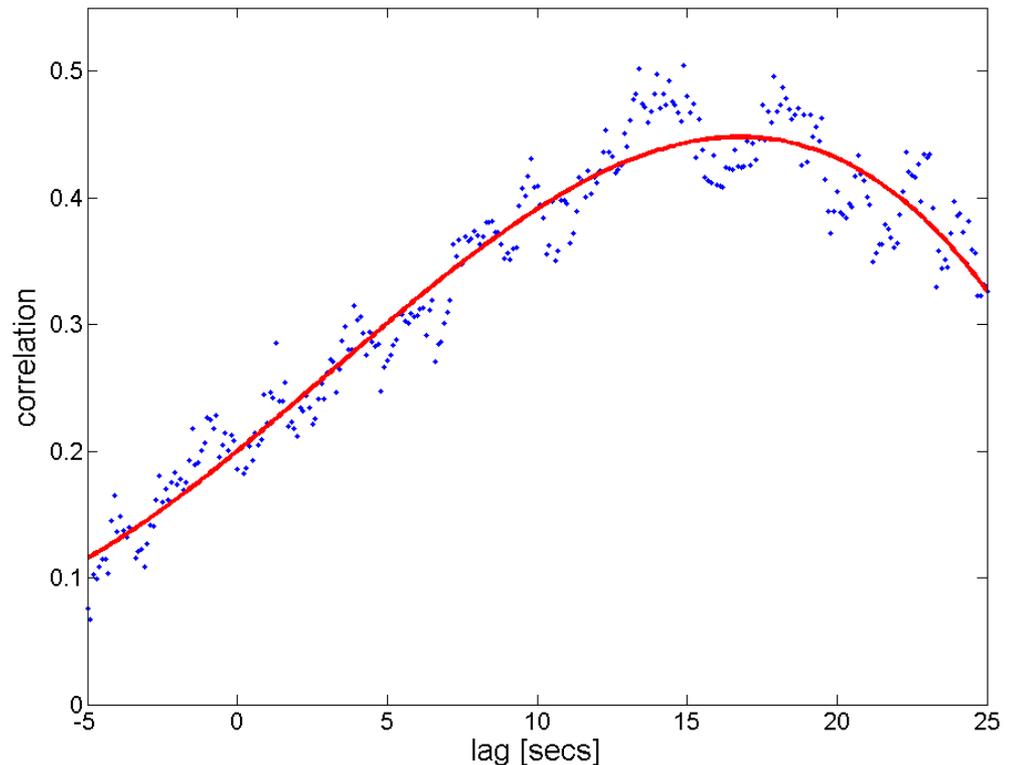
# Swarming in coherent groups

**Collective navigation**

**Optical flow analysis:**

The turning point predicts direction

**Bacteria use the internal organization to navigate the tip.**

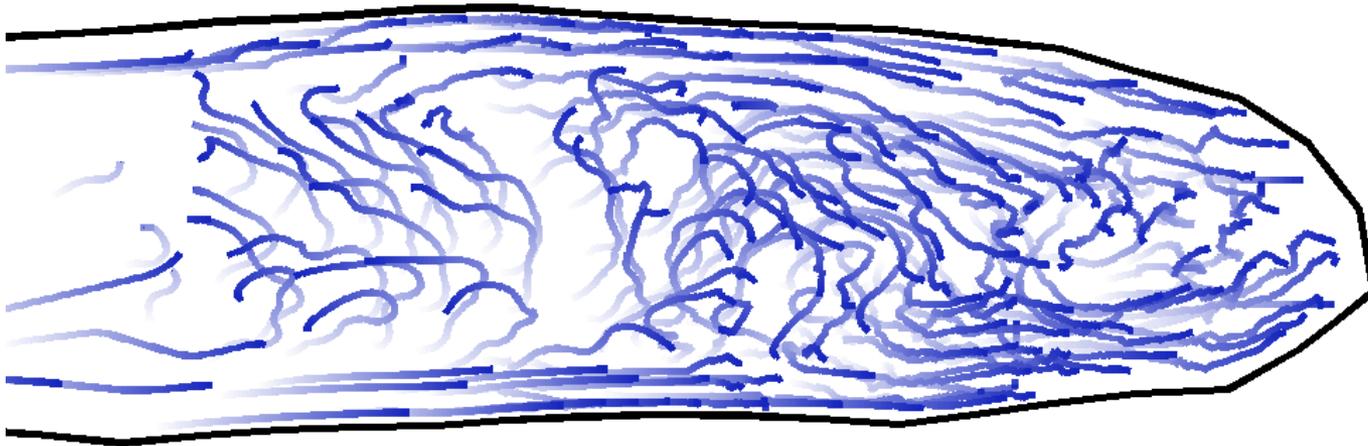


# Modeling

- **Biological perspective:** Identify the key interactions and communication mechanisms bacteria use for cooperation and strategy selection.
- **Mathematical perspective:**
  - A bottom-up approach.
  - Study the interaction between the internal flow and a dynamic boundary.
  - A non- standard fluid model - sheer flow.

# Modeling

- 2D
- **Agent based modeling –**  
coarse graining, groups of bacteria.
- **Dynamic envelope**



# Modeling

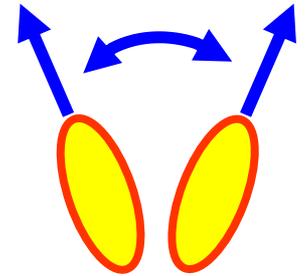
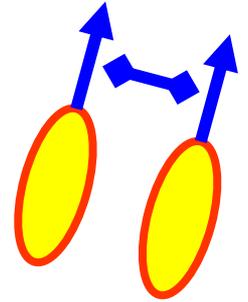
- **Self propelled particles**

Acceleration depends on food,

Inelastic collisions

Alignment b/w agents and boundary,

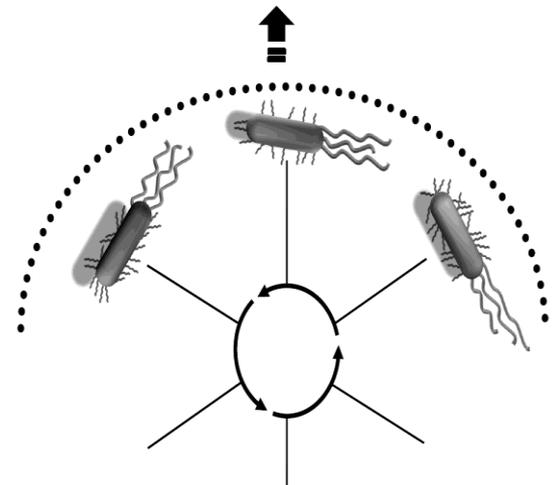
Repulsion from neighbors.



- **Dynamic envelope**

Surface tension,

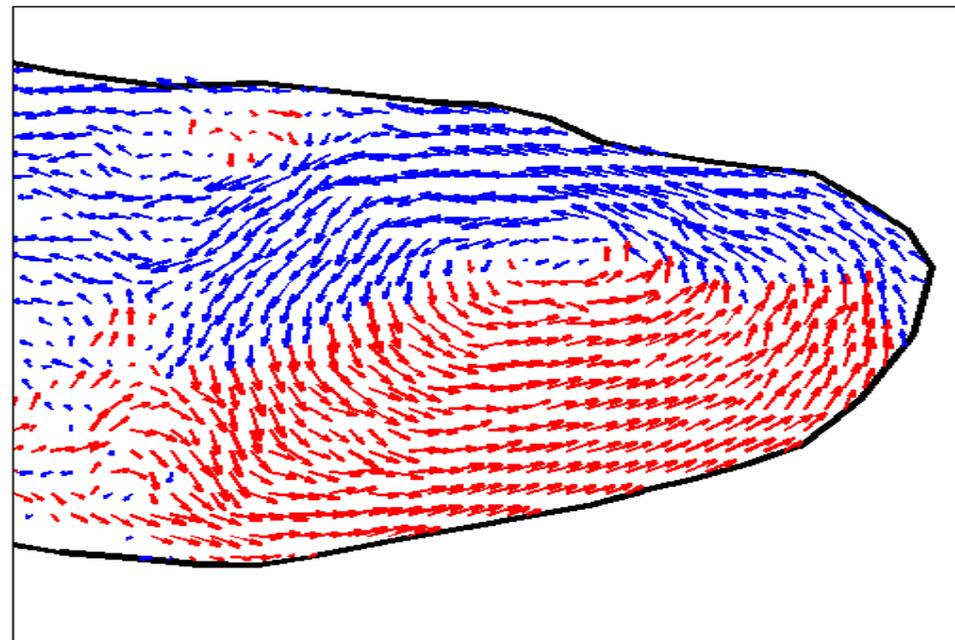
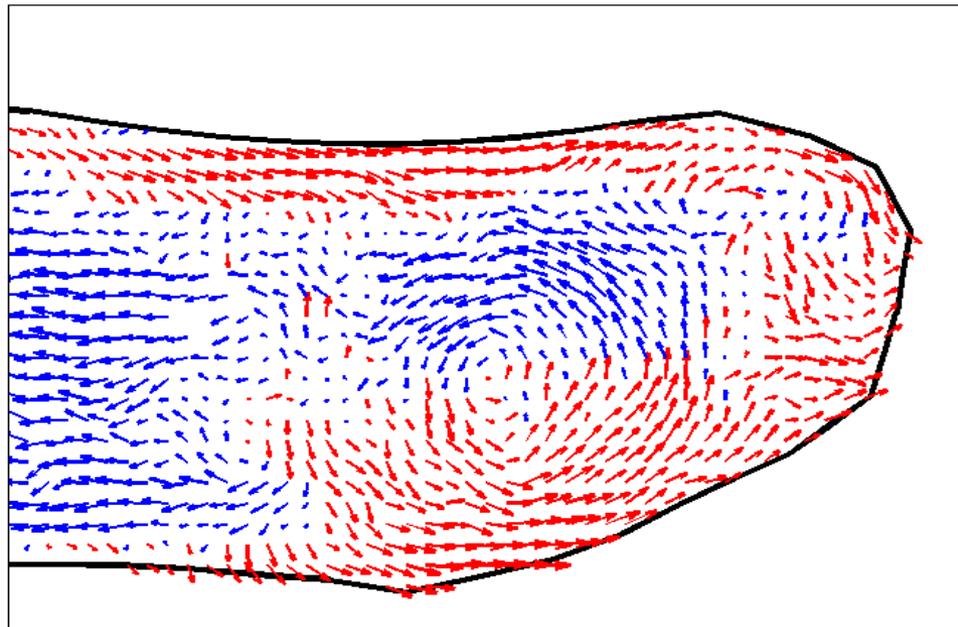
A phenomenological expression for the normal speed of the boundary  $v \times \hat{v} \times \nabla n$ .



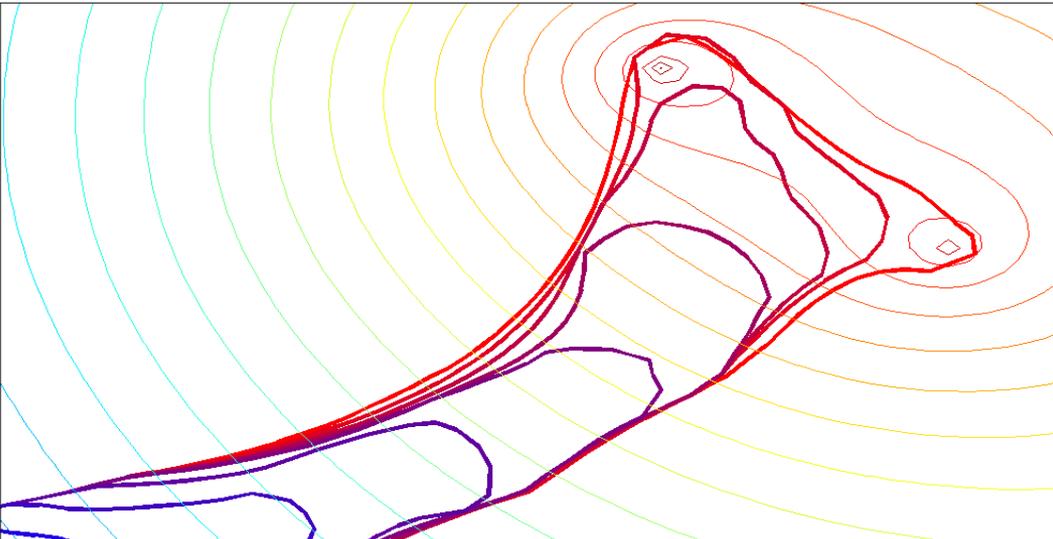
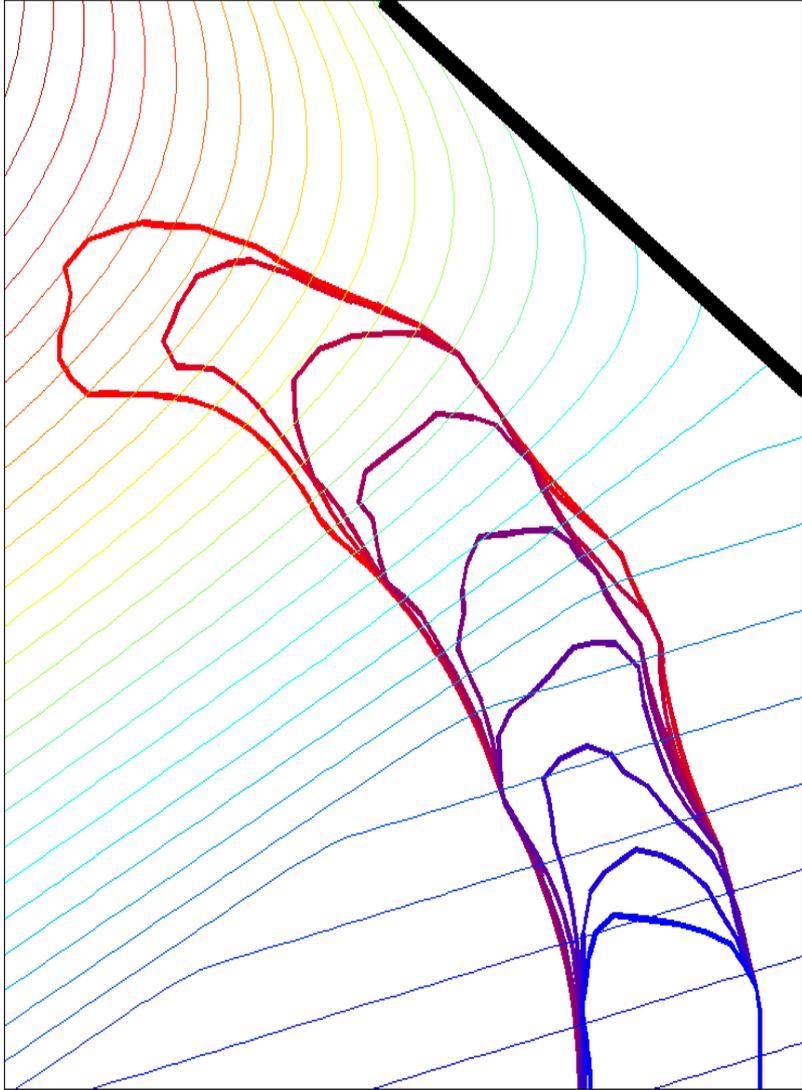
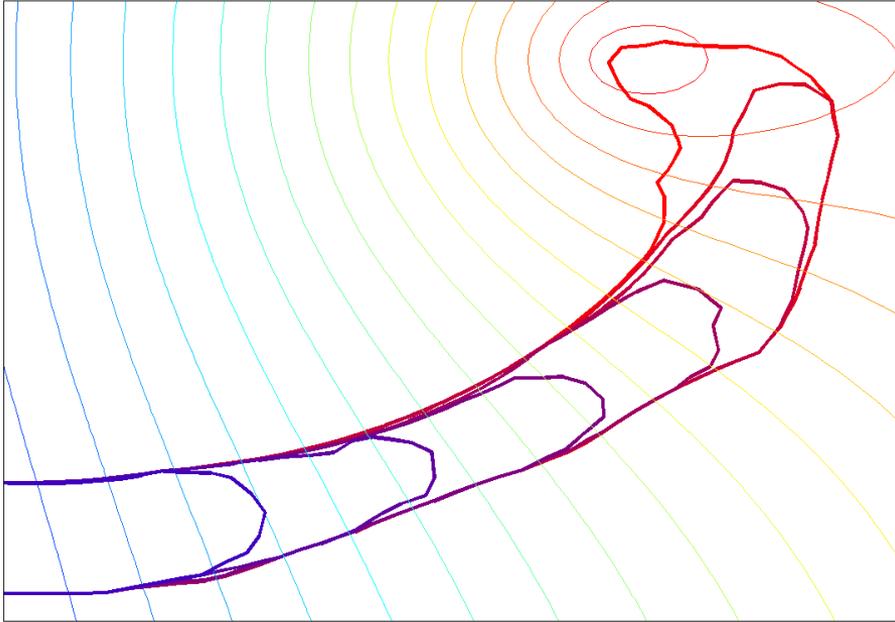
# Modeling Results

## Two stable dynamical states

- Standing tip with 2 lanes. [movie](#)
- Advancing tip with 3 lanes. [movie](#)

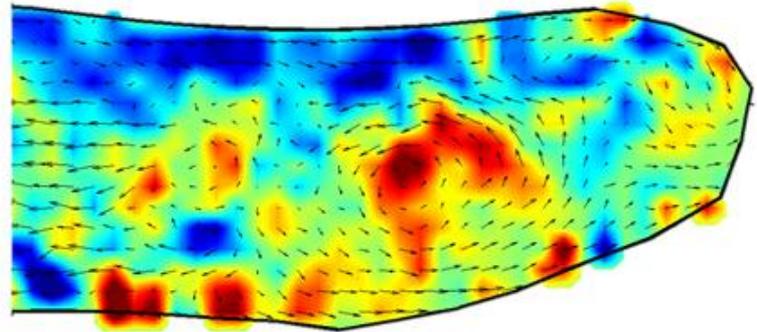
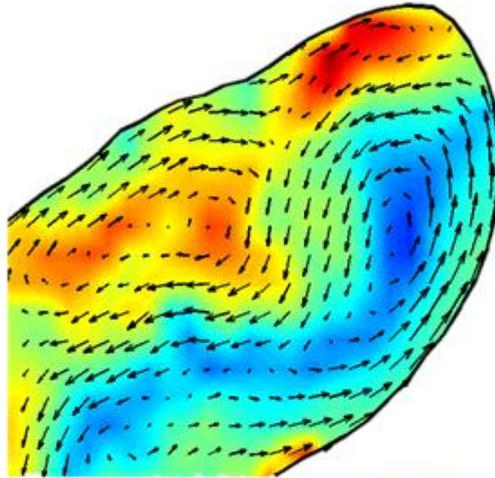


# Modeling Results

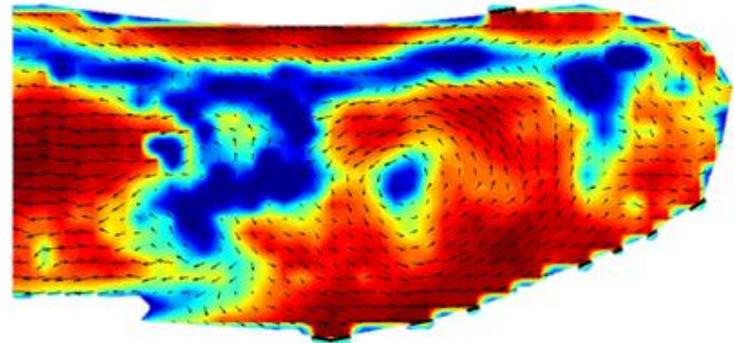
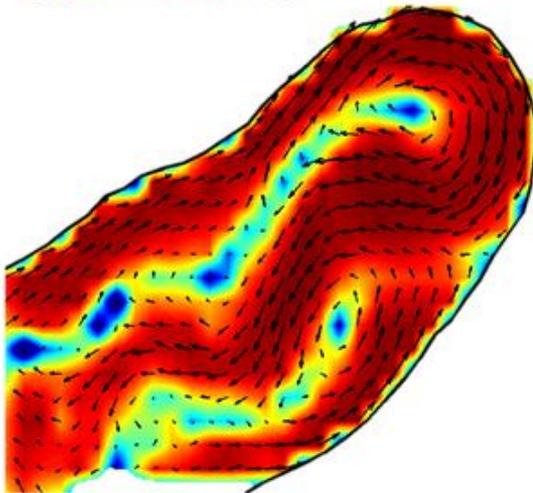


# Analysis of the flow

vorticity



order  
parameter

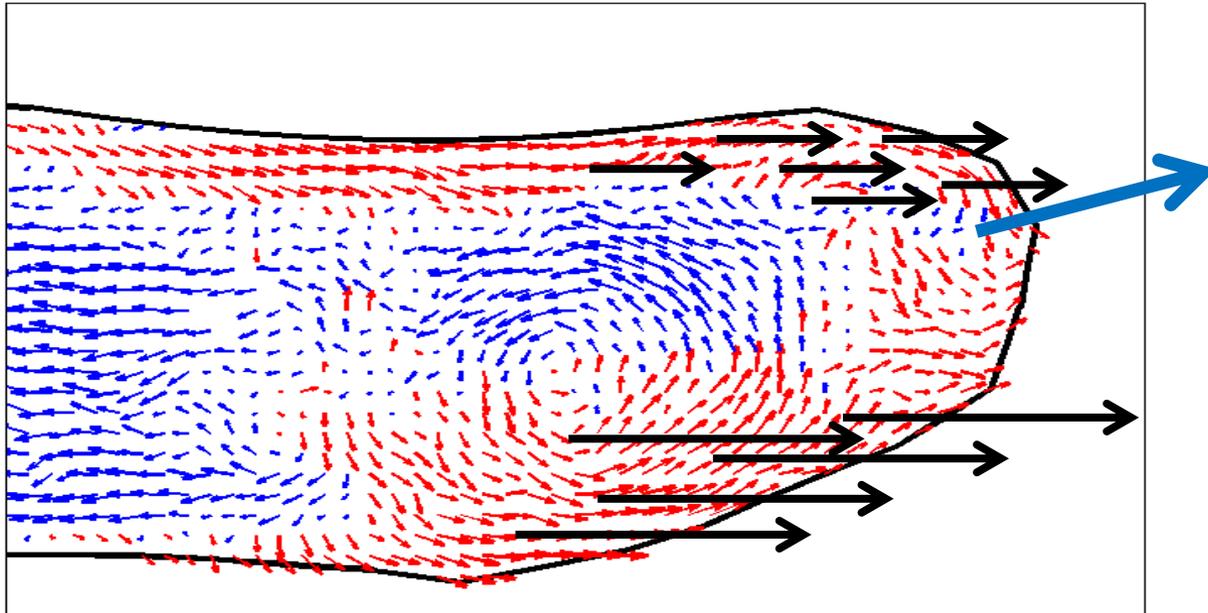


experiment

simulation

# What we learn from simulations

- **Interaction depend on velocity.** alignment and speed matching dominate over collisions.
- **Strong coupling between flow and boundary** – bacteria use the internal organization to navigate the tip.



# PDE models

- **High density** (crowd dynamics)
- **Free boundary**
- **Director fields** (liquid crystals)
- **Shear flow – the velocity field is discontinuous**

[movie](#)

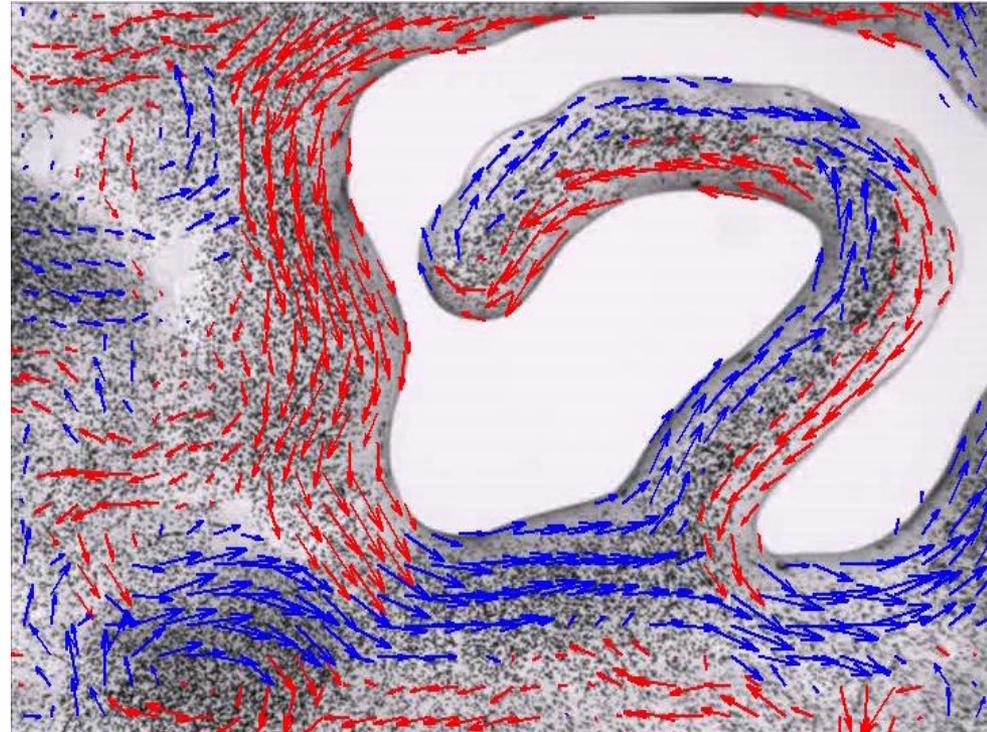
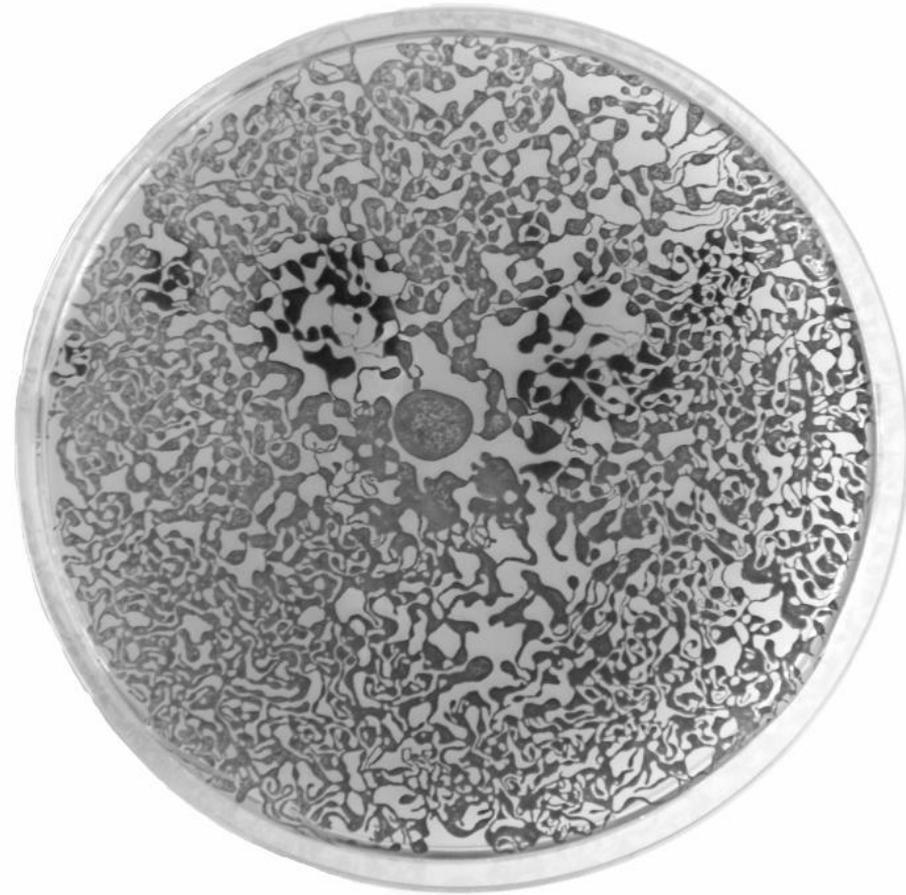
Previous approaches fail

Non-linear diffusion [Ben-Jacob et al '96 '00]

Non-local kinetic equation [Mogilner and Edelshtein-Keshet et al '99,  
Topaz and Bertozzi '04]

and more ...

# Swarming logistics



**multiscale approach**



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a natural wonder with great  
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