

# Lecture 4: Hydrodynamics of Bacterial Suspensions

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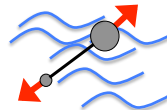
- Aphrodite Ahmadi (SU → SUNY Cortland)
- Shiladitya Banerjee (SU)
- Aparna Baskaran (SU → Brandeis)
- Luca Giomi (SU → Brandeis/Harvard)
- Tannie Liverpool (Bristol, UK)
- Gulmammad Mammadov (SU)
- Shradha Mishra (SU)

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## Plan

The methods outlined in the last lecture can be used to derive hydrodynamics for a collection of active particles in a medium with other interactions:

- Short-range interactions due to cluster of motor proteins crosslinking cytoskeletal filaments → relevant to cell cytoskeleton and cytoskeletal extracts
- Fluid-mediated hydrodynamic interactions → relevant to bacterial suspensions.

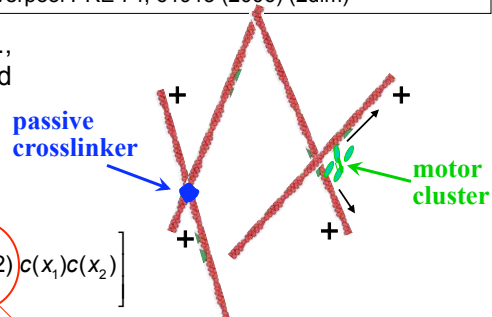


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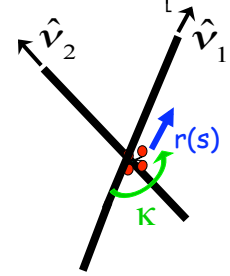
### Cytoskeletal filaments & motor proteins

Kruse & Julicher, PRE 67, 51913 (2003) (1dim)  
Ahmadi, MCM & Liverpool PRE 74, 61913 (2006) (2dim)

Cytoskeletal filaments (e.g., actin) as polar rods coupled by **passive** and **active** crosslinkers



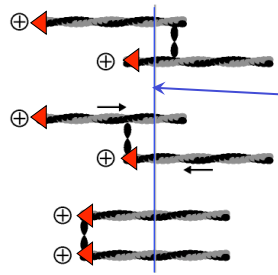
Smoluchowski:

$$\partial_t c(x_1) = \partial_{x_1} \left[ D \partial_{x_1} c(x_1) + \int_{x_2} \frac{1}{\epsilon} F(12) c(x_1) c(x_2) \right]$$


Velocity induced on filament 1 by filament 2 via active crosslinker. Obtained from kinematics of two polar rods crosslinked by an active motor cluster, modeled as a 2-headed rigid object with finite torsional stiffness  $\kappa$  that steps at a rate  $r(s)$  along each filament.

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### 1. Motors drive filament bundling, e.g., 1dim: Kruse & Julicher, PRL 75, 1778 (2000)



$$u(s) = a \frac{dATP}{dt} \sim nm / \mu sec$$

Mechanism for contractility, effective in both polar and apolar systems. In this model it **requires motor stalling at end.**

bundling "rate":  $\alpha \sim \langle s u(s) \rangle_{\text{length of filament}}$

Builds up density inhomogeneities → pattern formation

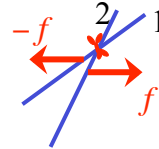
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## 2. Motors yield mass transport

Liverpool & MCM, EPL 69, 846 (2004)

Although a motor-filament pair is a force dipole, i.e.,  $F_{NET}=0$ , the anisotropy of rod diffusion yields  $v_{CM} \neq 0$

$$\begin{cases} \xi_{ij}(\hat{v}_1)v_{1j} = -f_i \\ \xi_{ij}(\hat{v}_2)v_{2j} = f_i \\ \vec{v}_{CM} = \frac{\vec{v}_1 + \vec{v}_2}{2} \neq 0 \end{cases}$$



$$\xi_{ij}(\hat{v}) = \xi_{\parallel} \hat{v}_j + \xi_{\perp} (\delta_{ij} - \hat{v}_i \hat{v}_j)$$

active velocity:

$$v_{CM} \equiv \beta \sim \langle u(s) \rangle_{\text{length of filament}}$$

Self-propulsion as a generic property of all **polar** active units:

- apolar  $v_{CM}=0$
- polar  $v_{CM} \neq 0$

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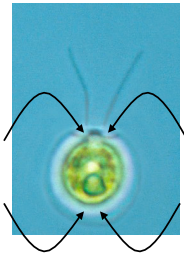
## Bacterial Suspensions: Outline

- The simplest "swimmer": pullers vs pushers
- Microdynamics of interacting swimmers
- Hydrodynamic interactions
- Instabilities and other results
- Outlook

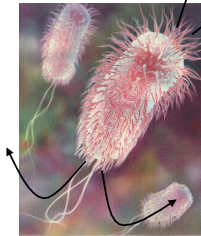
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The locomotion of individual organisms is controlled by a cyclic “stroke” (motion of cilia, flagella, ...) → Extensive models of individual swimmers and some progress in understanding pair interaction (Childress, Purcell, Golestanian, Yeomans, Lauga, Powers, ...)

Chlamydomonas  
“pullers”



E-coli  
“pushers”



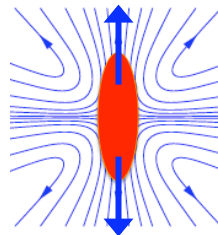
Our focus: collective behavior on lengths  $\gg$  swimmer size & times  $\gg$  stroke duration :  
How do different classes of propulsion mechanisms affect the collective macroscopic physics?

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### A swimmer as a force dipole



At distances  $\gg L$  and on times  $\gg$  duration of one stroke, the forces exerted by swimmer on fluid can be approximated as a static **force dipole**



- No acceleration ( $Re \ll 1$ ), net force must vanish
- Approximation is ok because we are interested in collective effects, not in the properties of individual swimmers
- Flow generated by a swimmer is complex and contains all multipoles - these will be generated by hydrodynamic interactions

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### The "simplest swimmer"

- $Re \ll 1 \rightarrow$  neglect inertia
- Neutrally buoyant
- Swimmer rides w/ fluid

One swimmer:

$$\partial_t \vec{r}_L = \vec{v}(\vec{r}_L)$$

$$\partial_t \vec{r}_S = \vec{v}(\vec{r}_S)$$

Many swimmers  
( $\alpha=1, \dots, N$ )

$$\partial_t \vec{r}_{\alpha L} = \vec{v}(\vec{r}_{\alpha L})$$

$$\partial_t \vec{r}_{\alpha S} = \vec{v}(\vec{r}_{\alpha S})$$

Flow field generated by swimmer is given by the Stokes equation :

$$\vec{\nabla} \cdot \vec{v} = 0$$

$$\eta \nabla^2 \vec{v} = \underbrace{f \hat{u} \delta(\vec{r} - \vec{r}_L) - f \hat{u} \delta(\vec{r} - \vec{r}_S)}_{\text{active forces exerted by swimmer on fluid}} + \text{noise}$$

$$\eta \nabla^2 \vec{v} = \sum_{\alpha} \underbrace{[f \hat{u}_{\alpha} \delta(\vec{r} - \vec{r}_{\alpha L}) - f \hat{u}_{\alpha} \delta(\vec{r} - \vec{r}_{\alpha S})]}_{\text{active forces exerted by all swimmers on fluid}} + \text{noise}$$

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## Two approaches

a) Solve Stokes eqn. to obtain the flow velocity  $v$ .

$$\left. \begin{aligned} \eta \nabla^2 \vec{v} &= \vec{F}^{act} \\ \vec{\nabla} \cdot \vec{v} &= 0 \end{aligned} \right\}$$

$$v_i(\vec{r}) = \int_{\vec{r}'} O_{ij}(\vec{r} - \vec{r}') F_j^{act}(\vec{r}')$$

$$O_{ij}(\vec{r}) = \frac{1}{8\pi\eta r} (\delta_{ij} + \hat{r}_i \hat{r}_j)$$

Oseen tensor

Eliminate  $v$  from the eqs of motion for the swimmers  $\rightarrow$  fluid flow is recast as hydrodynamic forces and torques on swimmers. Next, coarse grain the resulting microdynamics of interacting swimmers.

b) Retain the Stokes equation and obtain a hydrodynamic two-fluid model that contains explicitly the flow velocity.

Advantage of (a):

- physical insight on role of hydrodynamic interactions
- crucial role of long-range nature of hydrodynamic forces

Advantage of (b):

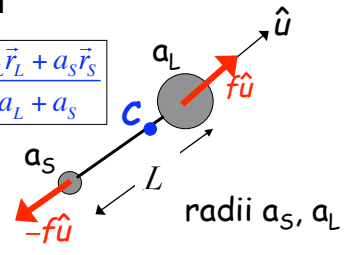
- straightforward comparison with phenomenological theory.

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### One swimmer

Rigid body dynamics at low Re:  
Translation of & rotation about hydrodynamic center C, determined by shape (not mass distribution)

$$\vec{r}_C = \frac{a_L \vec{r}_L + a_S \vec{r}_S}{a_L + a_S}$$



$$\begin{aligned} \partial_t \hat{u} &= \vec{\Gamma}_R(t) \\ \partial_t \vec{r}_C &= v_0 \hat{u} + \vec{\Gamma}(t) \end{aligned}$$

$v_0 \sim \frac{f(a_S - a_L)}{\zeta L}$

Although NET FORCE=0, SP  $v_0$  is finite if hydrodynamic center C does **not** coincide with center of force dipole

- Polar (head  $\neq$  tail)  $v_0 \neq 0 \rightarrow$  "mover"
- Apolar (head=tail)  $v_0=0 \rightarrow$  "shaker"

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### Many swimmers

$$\begin{aligned} \partial_t \vec{r}_{\alpha C} &= v_0 \hat{u}_\alpha + \frac{1}{\zeta} \sum_{\beta \neq \alpha} \vec{F}_{\alpha\beta} + \vec{\Gamma}_\alpha(t) \\ \partial_t \hat{u}_\alpha &= \frac{1}{\zeta L^2} \sum_{\beta \neq \alpha} \vec{\tau}_{\alpha\beta} + \vec{\Gamma}_\alpha^R(t) \end{aligned}$$

Multipole expansion of force distribution about hyd. centers  
 $\zeta = \zeta_S + \zeta_L = 6\pi\eta(a_S + a_L)$

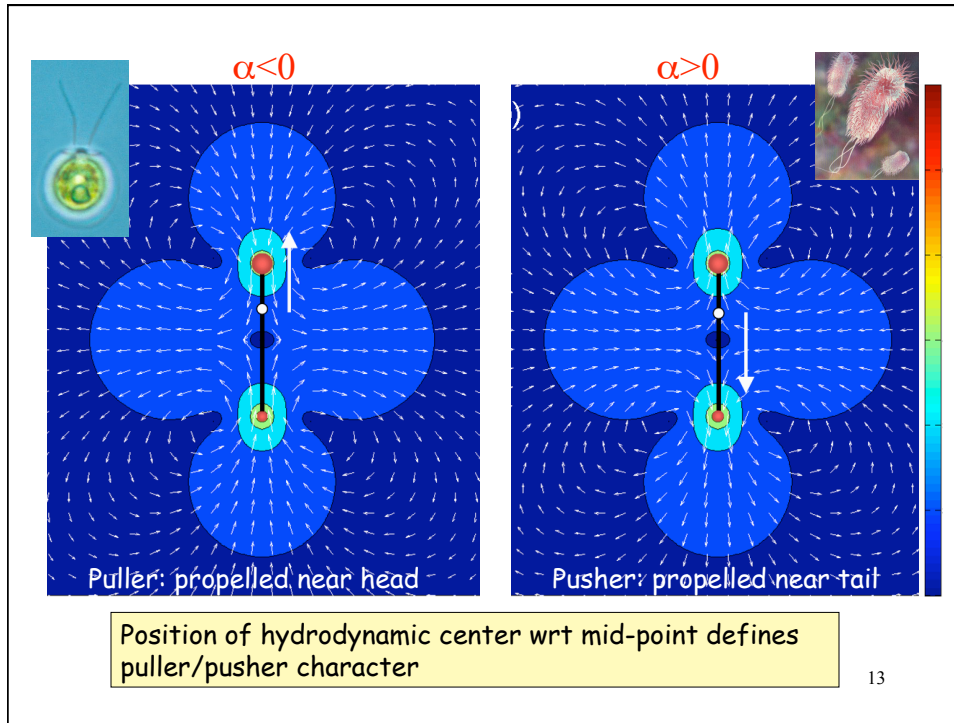
$$\begin{aligned} \vec{F}_{12} &\approx \hat{r}_{12} \frac{\alpha}{r_{12}^2} [3(\hat{r}_{12} \cdot \hat{u}_2)^2 - 1] \\ \vec{\tau}_{12} &\approx \hat{u}_1 \times [3\hat{r}_{12} \hat{r}_{12} - \vec{1}] \cdot \hat{u}_2 \left[ \frac{\alpha_R}{r_{12}^3} (\hat{u}_1 \cdot \hat{u}_2) - \frac{\beta}{r_{12}^5} \right] \end{aligned}$$

Polar symmetry  
 $\beta \sim f(a_L - a_S) \sim v_0$

Nematic symmetry  
 $\alpha, \alpha_R \sim f(a_L + a_S)$

- Central, dipolar forces,  $\sim 1/r^2$
- Sign of  $\alpha \rightarrow$  pusher (tensile) vs puller (contractile)

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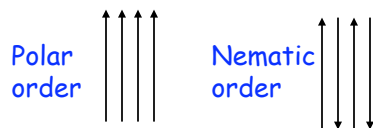


### From Microdynamics to Hydrodynamics

Use standard tools of nonequilibrium statistical physics to construct dynamical equations for continuum fields on lengths  $\gg L$ , times  $\gg$  stroke cycle

$$\begin{aligned} \rho(\vec{r}, t) &= \left\langle \sum_{\alpha} \delta(\vec{r} - \vec{r}_{\alpha C}(t)) \right\rangle && \text{concentration of swimmers} \\ \vec{P}(\vec{r}, t) &= \frac{1}{\rho(\vec{r}, t)} \left\langle \sum_{\alpha} \hat{v}_{\alpha} \delta(\vec{r} - \vec{r}_{\alpha C}(t)) \right\rangle && \text{polar order} \\ Q_{ij}(\vec{r}, t) &= \frac{1}{\rho(\vec{r}, t)} \left\langle \sum_{\alpha} (\hat{v}_{\alpha i} \hat{v}_{\alpha j} - \frac{1}{3} \delta_{ij}) \delta(\vec{r} - \vec{r}_{\alpha C}(t)) \right\rangle && \text{nematic order} \end{aligned}$$

$$\begin{aligned} \partial_t \vec{r}_{\alpha C} &= v \hat{v}_{\alpha} + \frac{1}{\xi} \sum_{\beta \neq \alpha} \vec{F}_{\alpha\beta} + \vec{\Gamma}_{\alpha}(t) \\ \partial_t \hat{v}_{\alpha} &= \frac{1}{\xi L^2} \sum_{\beta \neq \alpha} \vec{\tau}_{\alpha\beta} + \vec{\Gamma}_{\alpha}^R(t) \end{aligned}$$



- Dilute suspensions
- Large SP regime  $L/r_{12} \ll 1$

### Hydrodynamics of an incompressible active suspension: two equivalent formulations

Flow field appears explicitly →  
natural formulation of  
phenomenological models:

$$\partial_t \rho + \vec{u} \cdot \vec{\nabla} \rho = -\vec{\nabla} \cdot \vec{j}$$

$$\partial_t \vec{P} + \vec{F}(\vec{\nabla} \vec{u}) = \text{forces \& torques}$$

$$\partial_t Q_{ij} + F_{ij}(\vec{\nabla} \vec{u}) = \text{forces \& torques}$$

$$\eta \nabla^2 \vec{u} = \text{active stresses,} \quad \vec{\nabla} \cdot \vec{u} = 0$$

In Stokes regime the flow field  $\mathbf{u}$   
**not** a dynamical variable

Flow field is eliminated  
at the outset and recast  
as hydrodynamic  
interactions among the  
swimmers

$$\partial_t \rho = -\vec{\nabla} \cdot \vec{J}$$

$$\partial_t \vec{P} = \text{forces \& torques}$$

$$\partial_t Q_{ij} = \text{forces \& torques}$$

Equivalent when  $\mathbf{u}$  is eliminated on LHS  
in terms of  $\rho, P, Q_i$

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### Hydrodynamics equations for active particles concentration and director field $\left[ \begin{array}{l} \rho_{total} = const \\ \vec{\nabla} \cdot \vec{v} = 0 \end{array} \right]$

$$\partial_t \rho_p + \vec{\nabla} \cdot (\rho_p (\vec{v} + \beta \vec{n})) = \vec{\nabla} \cdot D \vec{\nabla} \rho_p$$

$$(\partial_t + (\vec{v} + \beta \vec{n}) \cdot \vec{\nabla}) n_i + \omega_{ij} n_j = \lambda u_{ij} n_j + w \partial_i \rho_p + K \nabla^2 n_i$$

$$\partial_j \sigma_{ij} = 0 \rightarrow \eta \nabla^2 v_i = -\partial_j [\alpha n_i n_j + \beta (\partial_i n_j + \partial_j n_i)]$$

$$u_{ij} = \frac{1}{2} (\partial_i v_j + \partial_j v_i)$$

$$\omega_{ij} = \frac{1}{2} (\partial_i v_j - \partial_j v_i)$$

$\beta$  intrinsic to polar systems

$\alpha$  present in polar and nematic fluids

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## Microscopic Derivation

$$\left[ \begin{array}{l} \rho_{total} = const \\ \vec{\nabla} \cdot \vec{v} = 0 \end{array} \right]$$

We have eliminated the flow velocity from the outset in favor of (long-ranged) hydrodynamic interactions – schematically ( $G \sim 1/r^2$ ):

$$\begin{aligned} \partial_t \rho_p + \mathbf{v}_0 \cdot \vec{\nabla} (\rho_p \vec{n}) &= \vec{\nabla} \cdot D(\alpha) \vec{\nabla} \rho_p \\ (\partial_t + \mathbf{v}_0 \cdot \vec{\nabla}) n_i &= w \partial_i \rho_p + K(\alpha) \nabla^2 n_i \\ &+ \lambda \int_{\vec{r}'} \nabla_i G_{jk}(\vec{r} - \vec{r}') \nabla'_l [\alpha n_k n_l + \beta (\partial'_k n_l + \partial'_l n_k)] \end{aligned}$$

$\mathbf{v}_0 \sim$  self-propulsion intrinsic to polar systems;  $\beta \sim \mathbf{v}_0$   
 $\alpha \sim$  from active hydrodynamic forces:  $\alpha < 0$  for pullers,  $\alpha > 0$  for pushers

Microscopic expressions for various parameters ( $D, K, w$ ) that are renormalized by activity

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## Nonlocal hydrodynamics

Long-range hydrodynamics interactions ( $F \sim 1/r^2$ ) yield nonlocal hydrodynamic equations.

$$\underbrace{J_\alpha(\vec{r})}_{\text{current}} = \int d\vec{r}' \underbrace{K(\vec{r} - \vec{r}')}_{\text{nonlocal interaction}} \underbrace{\Phi_\alpha(\vec{r}') \Phi_\beta(\vec{r})}_{\text{hydrodynamic fields}}$$

When the eqs. are linearized, the nonlocality can be truncated in a small  $q$  expansion

$$\begin{aligned} \delta J_\alpha(\vec{r}) &\approx \Phi_{\beta 0} \int d\vec{r}' K(\vec{r} - \vec{r}') \delta \Phi_\alpha(\vec{r}') \\ &\rightarrow \Phi_{\beta 0} \tilde{K}(-\vec{q}) \delta \tilde{\Phi}_\alpha(\vec{q}) \approx \Phi_{\beta 0} [\tilde{K}_0 + iq \tilde{K}_1 + \dots] \delta \tilde{\Phi}_\alpha(\vec{q}) \end{aligned}$$

small & large distance cutoffs

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## Some Results

- Derivation of (nonlocal) hydrodynamics for pushers & pullers with microscopic expressions for parameters

- Steady-state solution of hydrodynamic eqs yields bulk states: **no bulk ordered state from pairwise hydrodynamic interactions**

→ Isotropic state:  $\rho = \text{const}$ ,  $P = Q = 0$

→ **Steric effects** yield **nematic** order at high concentration

→ **No polar state**: need **external** symmetry breaking, e.g., chemotaxis?

- Linearization around bulk states reveals instability of isotropic and ordered states → **pattern formation**.

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## Instability of Isotropic State: different mechanisms for pushers & pullers

### Pullers ( $\alpha < 0$ )

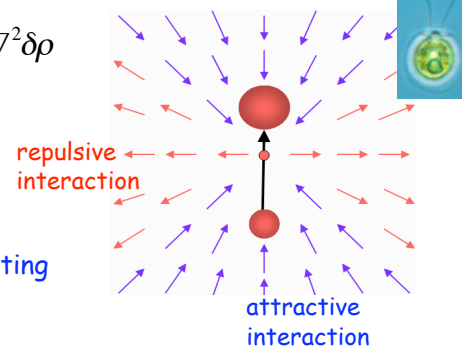
- 1) **growth of density fluctuations from a suppression of longitudinal diffusion due to active hydrodynamic interactions** (cf. Kruse & Julicher 2000; Liverpool & MCM 2003) → "clumping"

$$\partial_t \delta\rho + v_0 \vec{\nabla} \cdot \vec{P} = (D - |\alpha| \rho_0) \nabla^2 \delta\rho$$

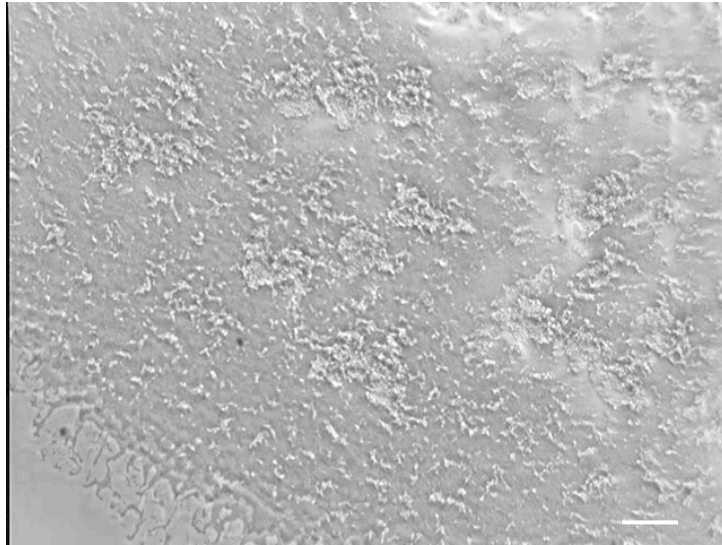
Controlled by Peclet number:

$$\frac{|\alpha|}{D} \sim \frac{(f/\xi)L}{D} \sim \frac{vL}{D} = Pe$$

- 2) above a critical  $v_0$ : propagating "sound-like" density waves



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Late stages of Myxo on starvation agar 1 mm  
Welch's lab, Syracuse University

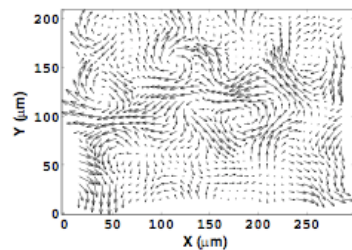
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## Instability of Isotropic state

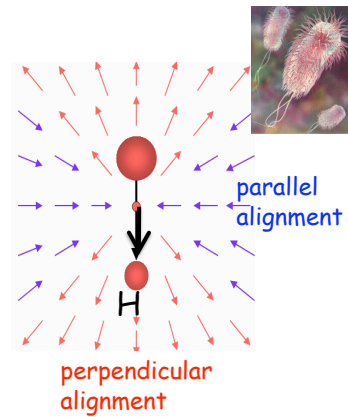
### Pushers ( $\alpha > 0$ )

orientational fluctuations are unstable on all scales when  $\alpha_R > D_R$  (cf. Saintillan & Shelley, 2008).

$$\partial_t Q_{\parallel\perp} = -(D_R - \alpha_R) Q_{\parallel\perp} + \dots$$



Dombrowski et al, PRL 2004:  
"turbulence" in a drop of Bacillus Subtilis



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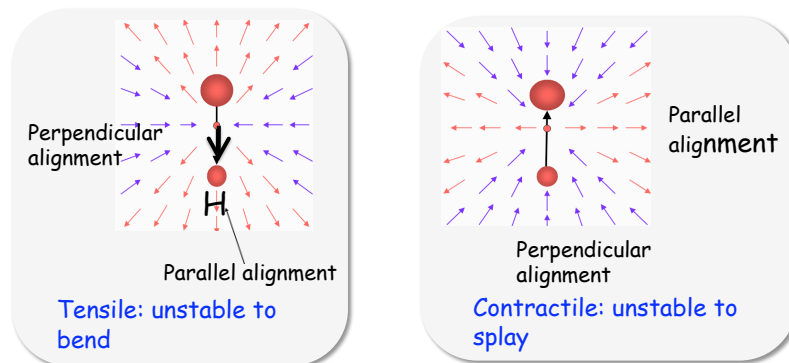
## Fluctuations in the Ordered state

- Ordered state **always** unstable on all scales due to coupling of orientation and flow: “generic instability” (Simha & Ramaswamy, PRL 2002)
  - Contractile / Puller : Splay fluctuations
  - Tensile / Pusher : Bend fluctuations
  
- Generic instability consequence of  $1/r^2$  interactions. Can be suppressed by:
  - Viscoelastic medium (screening)
  - Frictional substrate

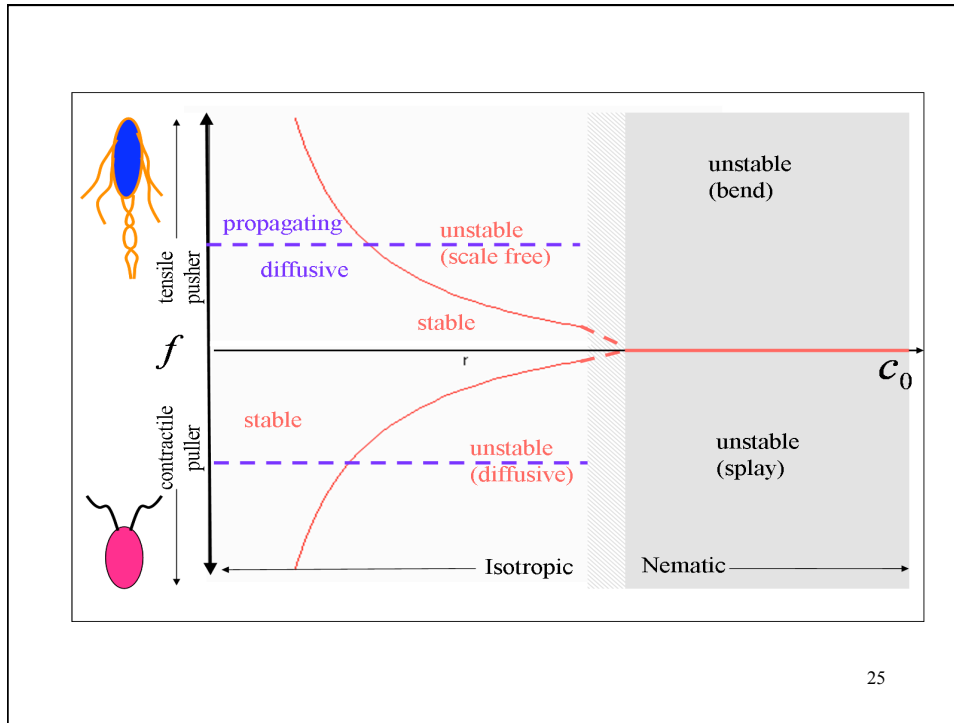
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## Ordered states

Ordered states of movers & shakers are unstable on all scales due to the coupling of orientation and flow  
 → “generic” instability (Ramaswamy & Simha, 2002)



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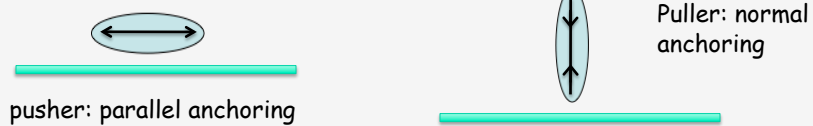


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## Conclusions

- Derivation of continuum theory from simple physical models yields unified description of many noneq. phenomena
- No physical mechanism for bulk polar order yet
- Insight into physical origin of emergent behavior in active systems and classification of such behavior

**A future direction:** incorporate the effect of boundaries (method of images, cf. Berke et al, 2008)



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