

# A Bio-energetic Modeling and Simulation of Myxobacteria Life-Cycle

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## Graduate Student and Collaborators

- The graduate student who is doing all the simulations is



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- We also collaborate with an experimental group at UCLA,



Wenyuan Shi

and his postdoc Renata Lux

# Outline

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# Cell Characteristics

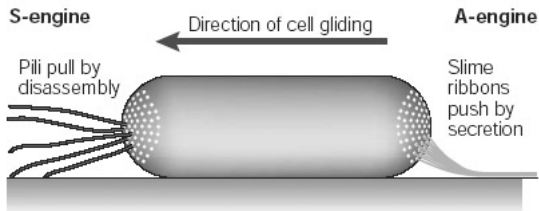
- Social behavior → complex multicellular organization
- Motility engines:
  - A(adventurous)-motility: slime secretion
  - S(social)-motility: pili

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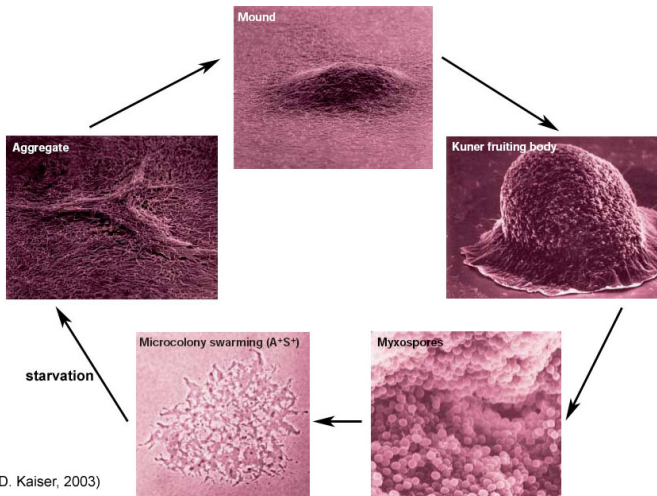


(Ref: D. Kaiser, 2003)

Myxobacteria strains:

- Motile: A+S+ (wild-type), A+S-, A-S+
- Nonmotile: A-S-

# Myxobacteria life cycle



(Ref. D. Kaiser, 2003)



## Fruiting body formation

- non-chemotaxis
- controlled by C-signal morphogen
- direct cell-cell local interaction

(Ref: S. Kim and D. Kaiser, 1990)

# Lattice vs. Off-Lattice model

- LGCA (Lattice Gas Cellular Automaton) model
  - uses hexagonal lattice
  - geometric constraint
- Off-Lattice model
  - free movement in space
  - reduce geometric constraint

(Ref: Y. Wu et al., 2006)

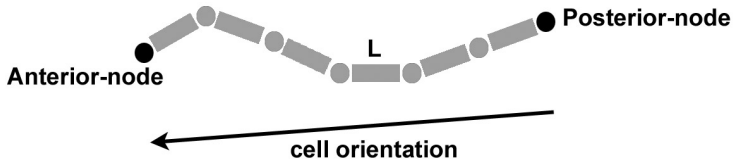
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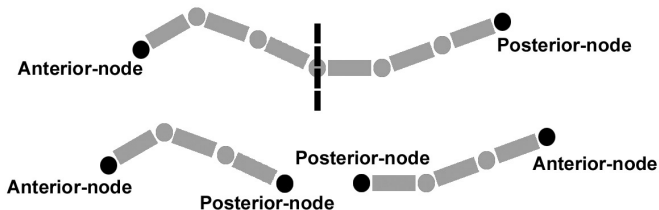
# Cell Representation

- string of 4 to 7 nodes, connected by segment
- cell orientation
- polarity reversal



# Cell Division

- cell waits until it has fully grown before dividing
- cell divides in the middle
- length of new cells is half of original cell

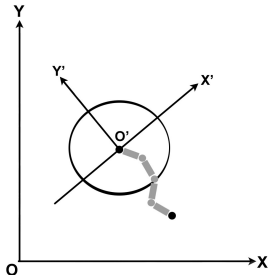


# General Assumptions

- cell movement is directed by anterior node
- cell moves with a fixed step length
- collision handling mechanism: align or stop

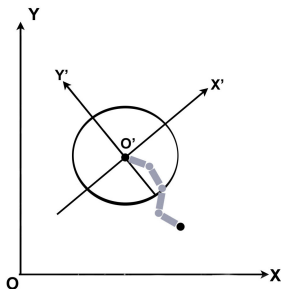
# Modeling A-motility

- searching circle
- turn at acute angle to follow slime trail
- need to consider cell density



# Modeling S-motility

- searching area around the anterior node
- cell moves towards the most crowded quadrant





# Modeling C-signaling

- C-signaling occurs when two cells are in end-to-end contact
- cell turns to direction that increases the level of C-signaling
- C-signaling triggers locking between cells
- N is number of C-signal molecules on the cell surface

$$\frac{dN}{dt} = \frac{cN(N_{\max} - N)}{N_{\max}} \quad (1)$$

Introduction

Off-Lattice Model

**Simulation Results**

Dynamic Energy Budget (DEB)

Fruiting Body Formation

A and S-motility

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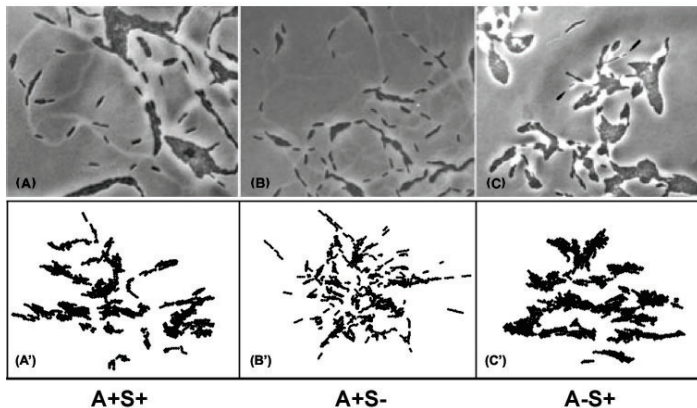
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A+S-

# Comparison with Experiments



(Ref: C. Wolgemuth et al., 2002)

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# C-signaling

# Dynamic Energy Budget

- describes how cells acquire and utilize energy for maintenance, growth and division
- uses  $\kappa$ -rule: a fixed fraction  $\kappa$  of energy flowing out of reserves is used for maintenance and growth, and the rest for reproduction
- trigger mechanism from the swarming stage to the stage of fruiting body formation

(Ref: S. Kooijman, 2000)

## DEB Model

$$\frac{dL}{dt} = \frac{\dot{\nu} (E/E_m) - (L/L_m)}{3 \left( g + (E/E_m) \right)} \quad (2)$$

$$\frac{dE}{dt} = \frac{A_m}{L} \left( f - \frac{E}{E_m} \right) \quad (3)$$

where

$$f = \frac{X}{K + X}, \quad \dot{\nu} = \frac{A_m}{E_m}, \quad g = \frac{G}{\kappa E_m} \quad (4)$$

$E$  = stored energy density,  $L$  = length,  $X$  = food density,

$\kappa$  = fraction of utilized energy spent on maintenance and growth,

$K$  = saturation coefficient,  $G$  = energy costs for a unit increase in size,

$E_m$  = max storage energy,  $L_m$  = max length,  $A_m$  = max assimilation rate

(Ref: R. Nisbet et al. and S. Kooijman, 2000)



## Non-dimensionalization

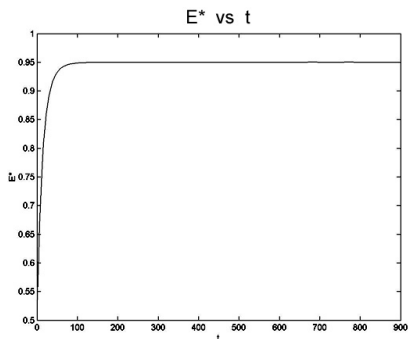
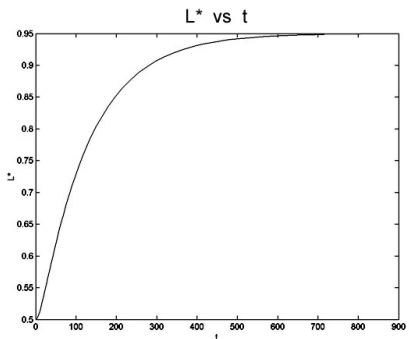
Let

$$L^* = \frac{L}{L_m}, \quad E^* = \frac{E}{E_m} \quad (5)$$

Then

$$\frac{dL^*}{dt} = \frac{\dot{\nu}}{3L_m} \frac{(E^* - L^*)}{(g + E^*)} \quad (6)$$

$$\frac{dE^*}{dt} = \frac{\dot{\nu}}{L^* L_m} (f - E^*) \quad (7)$$



Experimental data:

Doubling time = 3 hours ( $\sim 900$  time steps)

Cell length = 2-12  $\mu\text{m}$

Estimated parameters:  $f = 0.95$ ,  $\dot{\nu} = 0.25$ ,  $g = 0.5$

# Fruiting Body Formation

## Summary

- A interacting particle model of myxobacteria simulates the different swarming patterns of three strains of bacteria
- A dynamic energy budget (DEB) model controls the reproduction (splitting) of the bacteria and triggers the transition from swarming into the starvation phase
- In the starvation phase DEB, with the addition of C-signaling, controls the different stages of the fruiting body formations culminating in sporulation

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