Polymerization Model

Polymerization Ratchet 00000000000000 00000000 Conclusions 0000

# Mathematical Models for Molecular Motors: The Polymerization Ratchet

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# About Me

# Ph.D. in Applied Mathematics

# University of Washington, Seattle, WA, 2011

- Dissertation:
  - Mathematical Models for Facilitated Diffusion and the Brownian Ratchet
- Advisor:
  - Hong Qian

Undergraduate Degree:

- Macalester College, St. Paul, MN
- Math & Physics Major

From Tacoma, WA





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# Outline

### Introduction

Molecular Motors Motivation for the Polymerization Ratchet Model

### **Polymerization Model**

Model System & Simulations Analysis of the Mathematical Model

# Polymerization Ratchet Model

Single Polymer Ratchet N Polymer Bundle Ratchet

### Conclusions

Summary





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# What are Molecular Motors? In General Terms:

# Protein Molecules in the Cell that:

- Generate Forces
- Cause the Transport of Material





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# What are Molecular Motors?

### Two Specific Examples:



Muscle: http://www.bio.davidson.edu/people/midorcas/animalphysiology/websites/2011/Miller/Background.html Kinesin: http://multimedia.mcb.harvard.edu/media.html





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# **Conventional Molecular Motors**







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# Conventional Molecular Motors

### Kinesin

### Intracellular Transport Short Video Excerpt: Inner Life of the Cell



http://multimedia.mcb.harvard.edu/media.html





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# **Conventional Molecular Motors**

### Conventional Molecular Motors



http://www.bioch.ox.ac.uk/aspsite/index.asp?pageid=573

Move Along Polymer Tracks

- myosin actin microfilaments
- kinesin tubulin microtubules





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# Polymerization

# Another Way to Cause Motion/Transport

Change the Length of the Polymers Themselves!



- Polymerization: Adding Subunits
- Depolymerization: Subtracting Subunits
- (Subunits = Monomers)





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# Polymerization Causing Cell Membrane Deformation

### Sickle Cell Anemia: Sickle Hemoglobin Polymerization



Left: http://www.hopkinsmedicine.org/Medicine/sickle/patient/index.html

Right: (My Dissertation)







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# Depolymerization During Cell Division

# Mitosis: Depolymerization of Spindle Pulls Sister Chromatids Apart Two diploid cells δΝΔ replication Mitosis

http://www.ncbi.nlm.nih.gov/About/primer/genetics\_cell.html





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# Why Do We Care About Molecular Motors?

## Molecular Motors are Special Because:

- Chemical Energy  $\Rightarrow$  Mechanical Energy
  - DIRECTLY! (Not Via Heat or Electrical Energy)
- Highly Efficient:
  - 6 Times More Efficient than a Car
- Models for Molecular Motors
  - $\Rightarrow$  Theoretical Foundations for Nano-Engineering
    - Nano-mechano-chemical Machines
    - Tiny Robots!







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## Introduction Molecular Motors Motivation for the Polymerization Ratchet Model

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# Motivation: Actin-Based Motility

### Listeria monocytogenes:



http://textbookofbacteriology.net/Listeria\_2.html

At body temperature:

Bacteria that Causes *Listeriosis* Usually Only Flu-Like Symptoms, CDC Estimates that in the U.S.

- 1,600 People per Year Become Seriously III due to Listeriosis
- Out of Those, 260 Die

Listeria is propelled by polymerization of actin filaments.





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# Motivation: Actin-Based Motility

### Actin-Based Motility of Listeria (Click for Movie)



Image Source: Tilney & Portnoy 1989, *J Cell Biol* 109:1597-1608 Movie Source: Theriot & Portnoy: http://cmgm.stanford.edu/theriot/movies.htm





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# Motivation: Actin-Based Motility

# Actin-Based Motility of Listeria

Motivates Study of:

- Polymerization-Driven Motion of a Fluctuating Barrier
- Mathematical Framework:
  - Diffusion Formalism Brownian Ratchet Model
  - Building On Simplest Case: Single Polymer Ratchet





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# Single Polymer Ratchet Model

### What is a Single Polymer Ratchet?



Component 1:

### Polymer

- α<sub>p</sub>, β<sub>p</sub>: Adding/Subtracting Rates
- $\delta$ : Monomer Width
- α<sub>p</sub> > β<sub>p</sub>: Polymer Grows (On Average)





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# Single Polymer Ratchet Model

## What is a Single Polymer Ratchet?



Component 2: Fluctuating Barrier (Wall)

- α<sub>w</sub>
  "Left" Rate
- β<sub>w</sub>:
  "Right" Rate
- α<sub>w</sub> > β<sub>w</sub>: Barrier Moves "Left"





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# Single Polymer Ratchet Model

### What is a Single Polymer Ratchet?



### When Components Interact:

- Barrier Motion
  "blocked" by Polymer
- Polymer Growth "blocked" by Barrier





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# Single Polymer Ratchet Model

### What is a Single Polymer Ratchet?



### When Components Interact:

If Polymerization is "Fast:"

- Barrier Moves Away
- Polymer *Immediately* Grows
- Blocking Backward Fluctuation of Barrier

Barrier is "Ratcheted" Forward





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### Introduction

Molecular Motors Motivation for the Polymerization Ratchet Model

### Polymerization Model

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# Basic Polymerization Model System

### How does Polymerization Work?



• *x*: position of the end of the polymer

### Rate Constants:

- α<sub>p</sub>: adding a monomer (growth rate)
- β<sub>p</sub>: subtracting a monomer (shrinking rate)





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# Basic Polymerization Model System

# How does Polymerization Work?

# Deterministic Model:

• 
$$\frac{dx}{dt} = (\alpha_p - \beta_p)\delta$$

• x<sub>0</sub>: initial position



$$\overrightarrow{x(t)} = x_0 + (\alpha_p - \beta_p)\delta t$$





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# Polymer Position -vs- Time: Deterministic Model



Time





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# Basic Polymerization Model

# How does Polymerization Work?

# $\overbrace{\begin{tabular}{c} & & & \\ & & & & \\ & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & & & & \\ & &$

### Deterministic System:

- Motion is continuous in Space, Time
- Initial Condition
  - $\Rightarrow$  one possible trajectory
- Stochastic System:
  - Direction of motion Time motion occurs *Random*
  - Initial Condition
    ⇒ many possible trajectories





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# **Basic Polymerization Model**

# How does Polymerization Work?

Deterministic System:

- Motion is continuous in Space, Time
- Initial Condition
  - $\Rightarrow$  one possible trajectory

# Stochastic System:

- Direction of motion Time motion occurs *Random*
- Initial Condition
  ⇒ many possible trajectories







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# Stochastic Polymerization Model

Continuous-Time 1-D Biased Random Walk



Generate Exact Stochastic Simulations  $\Rightarrow$  Gillespie Algorithm

[Gillespie, 2007]





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# Simulation: Gillespie Algorithm

### Basic Simulation Scheme:



Start:  $t = t_0$ ,  $x = x_0$ .

- Wait dt for an "Event" to Occur. Set  $t = t_0 + dt$ .
  - If "Adding Event" Set  $x = x_0 + \delta$ .
  - If "Subtracting Event" Set  $x = x_0 - \delta$ .
- Repeat Until  $t = t_{max}$ .





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# Simulation: Gillespie Algorithm

### Basic Simulation Scheme:



Start:  $t = t_0$ ,  $x = x_0$ .

- Wait  $\frac{dt}{dt}$  for an "Event" to Occur. Set  $t = t_0 + dt$ .
  - If "Adding Event"
  - Set  $x = x_0 + \delta$ . • If "Subtracting Event"

Set 
$$x = x_0 - \delta$$
.

• Repeat Until  $t = t_{max}$ .





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# Simulation: Gillespie Algorithm

### Wait dt for an "Event" to Occur.



• Number of Events: *Poisson Process* with rate

$$\lambda = \alpha_{p} + \beta_{p}.$$

- $\Rightarrow dt$  is a random number from *Exponential Distribution*, rate  $\lambda$ .
- If *u* is a random number from a Uniform(0,1) Distribution,  $dt = -\frac{1}{\lambda} \log u$





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# Simulation: Gillespie Algorithm

### Basic Simulation Scheme:



Start:  $t = t_0$ ,  $x = x_0$ .

- Wait dt for an "Event" to Occur. Set  $t = t_0 + dt$ .
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- Repeat Until  $t = t_{max}$ .





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# Simulation: Gillespie Algorithm

### Decide which "Event" Occurs.

Probability of Subtracting or Adding:

• 
$$P(-) = \frac{\beta_p}{\alpha_p + \beta_p} = \frac{\beta}{\lambda}$$

• 
$$P(+) = \frac{\alpha_p}{\alpha_p + \beta_p} = \frac{\alpha_p}{\lambda}$$

• Note: 
$$P(-) + P(+) = 1$$
.

Generate a *Uniform(0,1)* random number, *u*.

- If  $0 \le u < P(-)$ , Subtract
- If  $P(-) \leq u \leq 1$ , Add







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# Simulation: Gillespie Algorithm

### Basic Simulation Scheme:



Start:  $t = t_0$ ,  $x = x_0$ .

- Wait dt for an "Event" to Occur. Set  $t = t_0 + dt$ .
  - If "Adding Event"
    - Set  $x = x_0 + \delta$ .
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- Repeat Until  $t = t_{max}$ .





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# Polymer Position -vs- Time: Simulated Data







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# Polymer Position -vs- Time: Simulated Data

 $x(t) = x_0 + (\alpha_p - \beta_p)\delta t, \quad \alpha_p = 4, \quad \beta_p = 1, \quad x_0 = 50$ 




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## Polymer Position -vs- Time: Simulated Data

$$x(t) = x_0 + (\alpha_p - \beta_p)\delta t, \quad \alpha_p = 4, \quad \beta_p = 1, \quad x_0 = 50$$



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## Stochastic Polymerization Model

#### Formulating the Mathematical Model:

Random Variable  $\mathbf{X}(t)$ : Position of Polymer Tip

- Discrete Space Model
  - $P_{X}(x,t) = \text{Prob}\{X(t) = x\}$
  - Biased Random Walk
- Continuous Space Model
  - $P_{\mathbf{X}}(x,t) = \operatorname{Prob}\{x < \mathbf{X}(t) \le x + dx\}$
  - Biased Brownian Motion





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# Single Polymer (No Barrier)

Random Variable X(t): Position of Polymer Tip

 $\frac{\partial P_{\mathbf{X}}(x,t)}{\partial t} = \alpha_{p} P_{\mathbf{X}}(x - \Delta x, t) + \beta_{p} P_{\mathbf{X}}(x + \Delta x, t) - (\alpha_{p} + \beta_{p}) P_{\mathbf{X}}(x, t)$  $\frac{\partial P_{\mathbf{X}}(x,t)}{\partial t} = D_{a} \frac{\partial^{2} P_{\mathbf{X}}(x,t)}{\partial x^{2}} - V_{a} \frac{\partial P_{\mathbf{X}}(x,t)}{\partial x}$ 



Discrete Space Model:

- $P_{\mathbf{X}}(x,t) = \operatorname{Prob}\{\mathbf{X}(t) = x\}$
- Biased Random Walk

To Obtain *Continuous Space* Model:

• Taylor Expand in x . . .





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Single Polymer (No Barrier)

Random Variable  $\mathbf{X}(t)$ : Position of Polymer Tip

 $\frac{\partial P_{\mathbf{X}}(x,t)}{\partial t} = \alpha_{p} P_{\mathbf{X}}(x - \Delta x, t) + \beta_{p} P_{\mathbf{X}}(x + \Delta x, t) - (\alpha_{p} + \beta_{p}) P_{\mathbf{X}}(x, t)$  $\frac{\partial P_{\mathbf{X}}(x,t)}{\partial t} = D_{a} \frac{\partial^{2} P_{\mathbf{X}}(x,t)}{\partial x^{2}} - V_{a} \frac{\partial P_{\mathbf{X}}(x,t)}{\partial x}$ 



Continuous Space Model:

- $P_{\mathbf{X}}(x,t) =$  $\operatorname{Prob}\{x < \mathbf{X}(t) \le x + dx\}$
- Biased Brownian Motion (Diffusion with Drift)

$$V_a = \lim_{\Delta x \to 0} (\alpha_p - \beta_p) \Delta x$$





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## Mathematical Model

#### Continuous Space Polymer Length Model

Partial Differential Equation for Diffusion with Drift

• 
$$\frac{\partial P_{\mathbf{X}}(x,t)}{\partial t} = D_{a} \frac{\partial^{2} P_{\mathbf{X}}(x,t)}{\partial x^{2}} - V_{a} \frac{\partial P_{\mathbf{X}}(x,t)}{\partial x}$$
$$D_{a} = \lim_{\Delta x \to 0} (\alpha_{p} + \beta_{p}) \frac{\Delta x^{2}}{2}, \qquad V_{a} = \lim_{\Delta x \to 0} (\alpha_{p} - \beta_{p}) \Delta x$$

Solution:

• 
$$P_{\mathbf{X}}(x,t) = \frac{1}{\sqrt{4\pi D_a t}} \exp\left(-\frac{(x-V_a t)^2}{4D_a t}\right)$$

(Brownian Motion)





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## Mathematical Model

#### Continuous Space Polymer Length Model (Click for Movie)



Solution:

• 
$$P_{\mathbf{X}}(x,t) = \frac{1}{\sqrt{4\pi D_a t}} \exp\left(-\frac{(x-V_a t)^2}{4D_a t}\right)$$

Gaussian (Normal) Distribution:

• 
$$P_{\mathbf{X}}(x,t) = \frac{1}{\sqrt{2\pi\sigma^2}} \exp\left(-\frac{(x-\mu)^2}{2\sigma^2}\right)$$

• 
$$\mu = V_{a}t$$

• 
$$\sigma^2 = 2D_a t$$





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## Basic Polymerization Model

#### How does Polymerization Work?

Deterministic System:

• Polymer Length:  $x(t) = V_a t$ 

Stochastic System:

• Polymer Length Distribution:  $P_{\mathbf{X}}(x, t) = \frac{1}{\sqrt{2\pi\sigma^2}} \exp\left(-\frac{(x-\mu)^2}{2\sigma^2}\right),$  $\mu = V_a t, \quad \sigma^2 = 2D_a t$ 







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#### Compare Simulated Data to Theoretical Results

 $\mu = V_a t, \quad \sigma^2 = 2D_a t, \quad V_a = 3, \quad D_a = 5/2, \quad x_0 = 50$ 





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#### Compare Simulated Data to Theoretical Results $\mu = V_a t$ , $\sigma^2 = 2D_a t$ , $V_a = 3$ , $D_a = 5/2$ , $x_0 = 50$ Single Polymer Growth Simulation 220 $x_0 + \mu$ 200 $x_0 + \mu + - \sigma$ 180 160 Position 140 120 100 0.5 80 0.4 60 40 0.2 10 20 30 0 0.1 Time $\mu + \sigma \mu + 2\sigma \mu + 3\sigma$ $\mu - 3\sigma \mu - 2\sigma \mu - \sigma$ и APPLIED MATHEMATICS



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#### Compare Simulated Data to Theoretical Results $\mu = V_a t$ , $\sigma^2 = 2D_a t$ , $V_a = 3$ , $D_a = 5/2$ , $x_0 = 50$ Single Polymer Growth Simulation 220 $x_0 + \mu$ 200 $x_0 + \mu + - \sigma$ x<sub>0</sub> + μ +/- 2σ 180 160 Position 140 120 100 0.5 80 0.4 60 40 0.2 20 0 10 0.1 Time $\mu = \mu + \sigma = \mu + 2\sigma = \mu + 3\sigma$ $\mu - 3\sigma \mu - 2\sigma \mu - \sigma$ APPLIED MATHEMATICS



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## Compare Simulated Data to Theoretical Results



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## Stochastic Polymerization Model Summary

#### Position of the End of a Single Polymer

- Simulation Scheme (Spatially Discrete Model)
- Analytical Result: Formula for Probability Distribution (Spatially Continuous Model)
- ⇒ Build On These to Formulate a Model for the Polymerization Ratchet!





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#### **Polymerization Model**

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## Single Polymer Ratchet Model

#### What is a Single Polymer Ratchet?



#### When Components Interact:

If Polymerization is "Fast:"

- Barrier Moves Away
- Polymer *Immediately* Grows
- Blocking Backward Fluctuation of Barrier

Barrier is "Ratcheted" Forward





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## Simulation: Gillespie Algorithm

#### Basic Simulation Idea



Start:  $t = t_0$ ,  $x = x_0$ ,  $y = y_0$ .

- Wait dt for an "Event" to Occur. Set  $t = t_0 + dt$ .
  - If "Polymer Adding Event" Set  $x = x_0 + \delta$ .
  - If "Polymer Subtracting Event" Set  $x = x_0 - \delta$ .
  - If "Wall Moves Right Event" Set  $y = y_0 + \delta$ .
  - If "Wall Moves Left Event"

Geometric Constraint: Polymer/Wall Can "Block" Events





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## Simulation: Gillespie Algorithm

#### Basic Simulation Idea



Start:  $t = t_0$ ,  $x = x_0$ ,  $y = y_0$ .

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Geometric Constraint: Polymer/Wall Can "Block" Events





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## Simulation: Gillespie Algorithm

# **Basic Simulation Idea** $\lambda = \alpha_p + \beta_p + \alpha_w + \beta_w$ $\dot{\alpha}_{w}$ $\beta_p$ $\alpha_p$

Start:  $t = t_0$ ,  $x = x_0$ ,  $y = y_0$ .

- Wait dt for an "Event" to Occur. Set  $t = t_0 + dt$ .
  - If "Polymer Adding Event" Set  $x = x_0 + \delta$ .
  - If "Polymer Subtracting Event" Set x = x<sub>0</sub> - δ.
  - If "Wall Moves Right Event" Set  $y = y_0 + \delta$ .
  - If "Wall Moves Left Event"

Set  $y = y_0 - \delta$ .

Geometric Constraint: Polymer/Wall Can "Block" Events





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## Single Polymer Ratchet Simulated Data

 $\alpha_p = 4, \quad \beta_p = 1, \quad \alpha_w = 2, \quad \beta_w = 1, \quad x_0 = y_0 = 50$ 





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## Single Polymer Ratchet Simulated Data

 $\alpha_p = 4, \quad \beta_p = 1, \quad \alpha_w = 2, \quad \beta_w = 1, \quad x_0 = y_0 = 50$ 



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#### Single Polymer Ratchet Simulated Data







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## Single Polymer Ratchet Simulated Data



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## Single Polymer Ratchet Model

#### Formulating the Mathematical Model:

#### Can Formulate both:

- Discrete Space Model
- Continuous Space Model

Focus on the *Continuous Space* Model Because:

- Analytical Results can be (More) Easily Obtained
- Easier to Incorporate Additional Features:
  - Attraction Between Polymer and Barrier
  - N Polymer Ratchet





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# Single Polymer (No Barrier)

#### Random Variable $\mathbf{X}(t)$ : Position of Polymer Tip



Continuous Space Model:

- $P_{\mathbf{X}}(x,t) =$  $\operatorname{Prob}\{x < \mathbf{X}(t) \le x + dx\}$
- Biased Brownian Motion (Diffusion with Drift)





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## Barrier (No Polymer)

Random Variable  $\mathbf{Y}(t)$ : Position of Barrier







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## Single Polymer Ratchet

Diffusion Formalism Model: [Qian, 2004]





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## Single Polymer Ratchet Simulated Data





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## Single Polymer Ratchet Simulated Data





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## Single Polymer Ratchet

Diffusion Formalism Model: [Qian, 2004]

$$\frac{\partial P_{\mathbf{x}\mathbf{y}}(x,y,t)}{\partial t} = D_a \frac{\partial^2 P_{\mathbf{x}\mathbf{y}}}{\partial x^2} + D_b \frac{\partial^2 P_{\mathbf{x}\mathbf{y}}}{\partial y^2} - V_a \frac{\partial P_{\mathbf{x}\mathbf{y}}}{\partial x} + \frac{F_{\text{ext}}}{\eta_b} \frac{\partial P_{\mathbf{x}\mathbf{y}}}{\partial y} \qquad (1)$$

$$\xrightarrow{F_{\text{ext}}} \eta_b, D_b$$

$$\xrightarrow{\text{Strategy: Decouple System}}$$



- Δ(t): Gap Distance
- **Z**(*t*): Average Position

Change of Variables:

• 
$$\mathbf{\Delta} = \mathbf{Y} - \mathbf{X}$$
,  $\mathbf{Z} = \frac{D_b \mathbf{X} + D_a \mathbf{Y}}{D_b + D_a}$ 







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## Single Polymer Ratchet

Diffusion Formalism Model: [Qian, 2004]

$$\frac{\partial P_{\mathbf{X}\mathbf{Y}}(x,y,t)}{\partial t} = D_a \frac{\partial^2 P_{\mathbf{X}\mathbf{Y}}}{\partial x^2} + D_b \frac{\partial^2 P_{\mathbf{X}\mathbf{Y}}}{\partial y^2} - V_a \frac{\partial P_{\mathbf{X}\mathbf{Y}}}{\partial x} + \frac{F_{ext}}{\eta_b} \frac{\partial P_{\mathbf{X}\mathbf{Y}}}{\partial y}$$
(1)

$$\frac{\partial P_{\Delta}(\Delta, t)}{\partial t} = (D_{a} + D_{b}) \frac{\partial^{2} P_{\Delta}}{\partial \Delta^{2}} + \left(V_{a} + \frac{F_{ext}}{\eta_{b}}\right) \frac{\partial P_{\Delta}}{\partial \Delta}, \quad (\Delta \ge 0)$$
(2a)  
$$\frac{\partial P_{z}(z, t)}{\partial t} = D_{z} \frac{\partial^{2} P_{z}}{\partial z^{2}} - V_{z} \frac{\partial P_{z}}{\partial z}, \quad -\infty < z < +\infty$$
(2b)

$$D_{a} = (\alpha + \beta)\frac{\delta^{2}}{2}, V_{a} = (\alpha - \beta)\delta$$
$$D_{z} = \frac{D_{a}D_{b}}{D_{b}+D_{a}}, V_{z} = \frac{D_{b}V_{a}-D_{a}F_{ext}/\eta_{b}}{D_{b}+D_{a}}$$

• (1) Constraint:  $\mathbf{X}(t) \leq \mathbf{Y}(t)$ 

• (2a) Constraint: 
$$oldsymbol{\Delta}(t) \geq 0$$





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## Single Polymer Ratchet: Gap Distance

Gap Distance Approaches a Steady State:

$$\frac{\partial P_{\Delta}(\Delta, t)}{\partial t} = (D_a + D_b) \frac{\partial^2 P_{\Delta}}{\partial \Delta^2} + \left(V_a + \frac{F_{ext}}{\eta_b}\right) \frac{\partial P_{\Delta}}{\partial \Delta}, \quad \Delta \ge 0$$

Subject to:

- No-Flux B.C. at  $\Delta = 0$
- Normalization Condition

"+": Diffusion  $\rightarrow$  Boundary Conditions: Can't "Leak Out"







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## Single Polymer Ratchet: Gap Distance

Gap Distance Approaches a Steady State:

$$\frac{\partial P_{\Delta}(\Delta, t)}{\partial t} = (D_a + D_b) \frac{\partial^2 P_{\Delta}}{\partial \Delta^2} + \left(V_a + \frac{F_{ext}}{\eta_b}\right) \frac{\partial P_{\Delta}}{\partial \Delta}, \quad \Delta \ge 0$$
  
Subject to:

- No-Flux B.C. at  $\Delta = 0$
- Normalization Condition



"+": Diffusion  $\rightarrow$  Boundary Conditions: Can't "Leak Out"



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## Single Polymer Ratchet: Gap Distance

 $P_{\Delta_{ss}}(\Delta)$ : Steady State Gap Distance

$$0 = D_{\delta} rac{d^2 P_{\mathbf{\Delta}_{ss}}}{d\Delta^2} + V_{\delta} rac{d P_{\mathbf{\Delta}_{ss}}}{d\Delta}, \qquad \Delta \geq 0$$

- $D_{\delta} = (D_a + D_b)$
- $V_{\delta} = \left(V_{a} + \frac{F_{ext}}{\eta_{b}}\right)$
- No-Flux B.C. at  $\Delta = 0$
- Normalization Condition

Steady State Distribution

• Exponential

$$P_{oldsymbol{\Delta}_{ss}}(\Delta) = rac{V_{\delta}}{D_{\delta}} e^{-rac{V_{\delta}\Delta}{D_{\delta}}}$$





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## Single Polymer Ratchet: Average Position

#### Average Position: Diffusion with Drift

$$\frac{\partial P_{\mathbf{Z}}(z,t)}{\partial t} = D_z \frac{\partial^2 P_{\mathbf{Z}}}{\partial z^2} - V_z \frac{\partial P_{\mathbf{Z}}}{\partial z}, \qquad -\infty < z < \infty$$

#### Solution:

• 
$$P_{\mathbf{Z}}(z,t) = \frac{1}{\sqrt{4\pi D_z t}} e^{-\frac{(z-V_z t)^2}{4D_z t}}$$

With:

• 
$$D_z = \frac{D_a D_b}{D_b + D_a}$$
,  $V_z = \frac{D_b V_a - D_a F_{ext}/\eta_b}{D_b + D_a}$ 

#### Normal Distribution

• Mean:

$$\mu = V_z t$$

• Variance:  $\sigma^2 = 2D_z$ 





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## Single Polymer Ratchet: Average Position

#### Average Position: Diffusion with Drift

$$\frac{\partial P_{\mathbf{Z}}(z,t)}{\partial t} = D_z \frac{\partial^2 P_{\mathbf{Z}}}{\partial z^2} - V_z \frac{\partial P_{\mathbf{Z}}}{\partial z}, \qquad -\infty < z < \infty$$

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#### Normal Distribution

• Mean:

$$\mu = V_z t$$

• Variance:  $\sigma^2 = 2D_z t$ 





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## Stochastic Polymerization Ratchet Model

#### Summary of Single Polymer Ratchet Results

- Gap Distance Reaches a Steady State
- Average Position Follows Biased Brownian Motion  $\mu = V_z t$  (Average of Drift Rates for Polymer and Barrier)

 ⇒ Build On These Results to Formulate a Model for the N Polymer Ratchet! (Hint at a Few Results)




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#### Introduction

Molecular Motors Motivation for the Polymerization Ratchet Model

#### **Polymerization Model**

Model System & Simulations Analysis of the Mathematical Model

## Polymerization Ratchet Model Single Polymer Ratchet N Polymer Bundle Ratchet

#### Conclusions

Summary





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# Motivation: Actin-Based Motility

#### Actin-Based Motility of Listeria (Click for Movie)



Image Source: Tilney & Portnoy 1989, *J Cell Biol* 109:1597-1608 Movie Source: Theriot & Portnoy: http://cmgm.stanford.edu/theriot/movies.htm





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## **N** Polymer Ratchet

### What is an N Polymer Ratchet?



Component 1: Bundle of N Identical Polymers





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## **N** Polymer Ratchet







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## **N** Polymer Ratchet

### What is an N Polymer Ratchet?



When Components Interact: Ratchet: Longest Polymer + Barrier





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## **N** Polymer Ratchet

## What is an N Polymer Ratchet?



N Polymer Ratchet:

Interaction Between:

- Longest Polymer
- Barrier
- Corresponds to:
  - Shortest
     Gap Distance





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# Stochastic Polymerization Ratchet Model

## Summary of N Polymer Ratchet Results

Observations from Simulated Data: Increasing Number of Polymers in the Bundle

- Allows Bundle to "Push Faster"
- Decreases the Mean Gap Distance Between *Bundle* and the Barrier

Supported by Analysis of *N*-Polymer Ratchet Model, [Cole and Qian, 2011]





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#### Introduction

Molecular Motors Motivation for the Polymerization Ratchet Model

#### **Polymerization Model**

Model System & Simulations Analysis of the Mathematical Model

#### Polymerization Ratchet Model

Single Polymer Ratchet N Polymer Bundle Ratchet

#### Conclusions

Summary





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## Conclusions

### Summary

In This Talk:

- 1. Single Polymer Growth Model (No Barrier)
  - Stochastic Simulations (Gillespie Algorithm)
  - Continuous Space Mathematical Model Results:
    - Polymer Position  $\sim$  Biased Brownian Motion (Diffusion with Drift)
- 2. Single Polymer Ratchet Model
- 3. N Polymer Bundle Ratchet Model





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# Conclusions

#### Summary

In This Talk:

- 1. Single Polymer Growth Model (No Barrier)
- 2. Single Polymer Ratchet Model
  - Stochastic Simulations (Gillespie Algorithm)
  - Continuous Space Mathematical Model Results:
    - Average (Ratchet) Position  $\sim$  Biased Brownian Motion (Diffusion with Drift)
    - Gap Distance  $\rightarrow$  Steady State, Exponential Distribution

3. *N* Polymer Bundle Ratchet Model





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# Conclusions

### Summary

In This Talk:

- 1. Single Polymer Growth Model (No Barrier)
- 2. Single Polymer Ratchet Model
- 3. N Polymer Bundle Ratchet Model
  - Stochastic Simulations (Gillespie Algorithm)
  - Increasing Number of Polymers in the Bundle:
    - Allows Bundle to "Push Faster"
    - Decreases the Mean Gap Distance between Bundle and Barrier
  - For More Information: [Cole and Qian, 2011]





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## Selected References



#### Cole, C. L. and Qian, H. (2011).

The brownian ratchet revisited: Diffusion formalism, polymer-barrier attractions, and multiple filamentous bundle growth.

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#### Gillespie, D. T. (2007).

Stochastic simulation of chemical kinetics. Annu Rev Phys Chem, 58:35–55.



#### Qian, H. (2004).

A stochastic analysis of a brownian ratchet model for actin-based motility and integrate-and-firing neurons.

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Conclusions

## Thank You!

- Advisor at UW: Hong Qian
- Organizers of the Colloquium
- Audience









# N Polymer Ratchet Simulated Data



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## Observations:

 $\alpha_p$ 

Adding Polymers to the Bundle:

- Increases Mean Gap Distance for Each Gap
- Decreases Mean Gap Distance for the Minimum Gap



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### Observations:

 $\alpha_p$ 

In Other Words,

Adding Polymers to the Bundle:

• Decreases Mean Gap Between Bundle and the Barrier



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# N Polymer Ratchet



# N Polymer Ratchet

Joint *pdf* for all  $\{\Delta_i(t)\}, \mathbf{Y}(t): f(\{\xi_i\}, z, t)$ 

$$\frac{\partial f(\{x_i\}, y, t)}{\partial t} = \sum_{k=1}^{N} \left( D_a \frac{\partial^2 f}{\partial x_k^2} - V_a \frac{\partial f}{\partial x_k} \right) + D_b \frac{\partial^2 f}{\partial^2 y} + \frac{F}{\eta_b} \frac{\partial f}{\partial y}$$
(3)

$$\frac{\partial \phi(\{\xi_i\}, t)}{\partial t} = \sum_{i,j}^{N} \left( D_a \delta_{ij} + D_b \right) \frac{\partial^2 \phi}{\partial \xi_i \partial \xi_j} + \left( V_a + \frac{F}{\eta_b} \right) \sum_{i=1}^{N} \frac{\partial \phi}{\partial \xi_i} \qquad (4a)$$
$$\frac{\partial P_z(z, t)}{\partial t} = \frac{D_b D_a}{N D_c + D_a} \frac{\partial^2 P_z}{\partial \tau^2} - \left( \frac{N D_b V_a - D_a F / \eta_b}{N D_c + D_a} \right) \frac{\partial P_z}{\partial \tau} \qquad (4b)$$

 $f(\lbrace x_i \rbrace, y, t) = f(\lbrace \xi_i \rbrace, z, t)$ Decoupled:  $= \phi(\lbrace \xi_i \rbrace, t) P_{\mathbf{Z}}(z, t)$  Geometric Constraints:

- For (3):  $\mathbf{X}_i(t) \leq \mathbf{Y}(t)$
- For (4a):  $\mathbf{\Delta}_i(t) \geq 0$



APPLIED MATHEMATICS

# N Polymer Ratchet: Gap Distance

Gap Distances Approach Steady State:

$$\phi(\{\xi_i\}) = \epsilon^N \exp\left(-\epsilon \sum_{i=1}^N \xi_i\right),$$

$$\epsilon = \frac{V_{a} + F/\eta_{b}}{ND_{b} + D_{a}},$$

$$P_{\mathbf{\Delta}_{(1)}}(x) = N \epsilon e^{-N \epsilon x}$$

 $\{ \Delta_i \}$ : Gaps are Identical, Exponentially Distributed

• 
$$\mu = \frac{1}{\epsilon} = \frac{ND_b + D_a}{V_a + F/\eta_b}$$

 $\begin{aligned} \mathbf{\Delta}_{(1)} &= \min\{\mathbf{\Delta}_i\} \\ \text{Exponentially Distributed} \\ \bullet & \mu = \frac{1}{N\epsilon} = \frac{D_b + D_a / N}{V_a + F / \eta_b} \end{aligned}$ 





# N Polymer Ratchet: Gap Distance

Gap Distances Approach Steady State:

$$\phi(\{\xi_i\}) = \epsilon^N \exp\left(-\epsilon \sum_{i=1}^N \xi_i\right)$$

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• 
$$\mu = \frac{1}{\epsilon} = \frac{ND_b + D_a}{V_a + F/\eta_b}$$

 $\begin{aligned} \mathbf{\Delta}_{(1)} &= \min{\{\mathbf{\Delta}_i\}}\\ \text{Exponentially Distributed}\\ \bullet & \mu = \frac{1}{N\epsilon} = \frac{D_b + D_a / N}{V_a + F / \eta_b} \end{aligned}$ 





# N Polymer Ratchet: Average Position

Average Position: Diffusion with Drift

$$\frac{\partial P_{\mathbf{Z}}(z,t)}{\partial t} = D_{z_N} \frac{\partial^2 P_{\mathbf{Z}}}{\partial z^2} - V_{z_N} \frac{\partial P_{\mathbf{Z}}}{\partial z}$$

Solution:

• 
$$P_{Z}(z,t) = \frac{1}{\sqrt{4\pi D_{z_N} t}} e^{-\frac{(z-V_{z_N} t)^2}{4D_{z_N} t}}$$

With:

• 
$$D_{z_N} = rac{D_a D_b}{N D_b + D_a}$$
,  
 $V_{z_N} = rac{N D_b V_a - D_a F / \eta_b}{N D_b + D_a}$ 



#### Normal Distribution

• Mean:

$$\mu = V_{z_N} t$$

• Variance:  $\sigma^2 = 2D_{z_N}t$ 



# Diffusion Formalism: Single Polymer Ratchet Full Time-Dependent Gap Distance Solution

Initial Boundary Value Problem for  $(x \ge 0, t > 0)$ :

•  $\frac{\partial P_{\mathbf{\Delta}}(x,t)}{\partial t} = D_{\delta} \frac{\partial^2 P_{\mathbf{\Delta}}}{\partial x^2} + V_{\delta} \frac{\partial P_{\mathbf{\Delta}}}{\partial x}$ •  $P_{\mathbf{\Delta}}(x,0) = \delta(x)$ 

• 
$$D_{\delta} \frac{\partial P_{\Delta}(0,t)}{\partial x} + V_{\delta} P_{\Delta}(0,t) = 0$$
  
•  $\lim_{x \to \infty} P_{\Delta}(x,t) = 0$   
 $\lim_{x \to \infty} \frac{\partial P_{\Delta}(x,t)}{\partial x} = 0$ 

Solution Via New Transform Method of Fokas

$$P_{\Delta}(x,t) = \frac{V_{\delta}}{D_{\delta}} e^{-\frac{V_{\delta}x}{D_{\delta}}} + e^{-\frac{V_{\delta}x}{2D_{\delta}}} e^{-\left(\frac{V_{\delta}}{D_{\delta}}\right)^{2} \frac{t}{4D_{\delta}}} \int_{0}^{\infty} \frac{z e^{-\frac{z^{2}t}{4D_{\delta}}} \left(z \cos(zx/2) - \frac{V_{\delta}}{D_{\delta}} \sin(zx/2)\right) dz}{\pi \left(\left(\frac{V_{\delta}}{D_{\delta}}\right)^{2} + z^{2}\right)}$$



