Undergraduate Mathematical Sciences Seminar

Modeling Cooperation Between Molecular Motors Polymer Growth Against a Force

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February 16, 2006

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What are Molecular Motors?

Protein molecules in the cell that:

- \blacktriangleright generate force
- \blacktriangleright cause transport

Instead (1) MoleceProgram on (8 & V.F.Marshy 2004

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Where are Molecular Motors?

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Intracellular Transport

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Polymerization as a Motor

- ▶ POLYMERIZATION-or-DEPOLYMERIZATION !
- \blacktriangleright (adding or subtracting monomers)

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Polymerization as a Motor - Biological Examples

Chromosome Transport During Anaphase

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Polymerization as a Motor - Biological Examples

Cell Membrane Deformation

Sickle Hemoglobin Polymerization creates Sickle Cells:

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Why Do We Care About Molecular Motors?

Molecular Motors are Special Because:

- \triangleright Chemical Energy \Rightarrow Mechanical Energy
	- \triangleright DIRECTLY! (not via heat or electrical energy)
- \blacktriangleright Highly Efficient
	- \triangleright 6 times more efficient than a car
- \triangleright Models for Molecular Motors \Rightarrow Nano-Engineering of Future
	- \triangleright Nano-mechano-chemical Machines
	- ▶ Tiny Robots!

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Artificial Nanomotors

Rotaxane

Vincenzo Balzani et. al. "Autonomous artificial nanomotor powered by sunlight" PNAS Vol. 103 No. 5 January 31, 2006. Rotaxane Molecule:

- $\triangleright \approx 5$ nm long (nm = 10⁻⁹ meters)
- powered by sunlight (photons)
- \triangleright operates at 1000 Hz \Leftrightarrow 60,000 rpm car engine

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How does Polymerization Work?

Rate Constants:

- k_{+} : second order rate constant of adding a monomer
- $k_$: first order rate constant of subtracting a monomer
- c: concentration of monomers in surrounding solution

Position of the end of the polymer can be modeled as a 1-D biased random walk.

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How does Polymerization Work?

 $P_n(t)$: probability length is *n* at time *t* Differential Equation for Polymer Length:

$$
\frac{dP_n(t)}{dt} = k_+ cP_{n-1}(t) + k_- P_{n+1}(t) - (k_+ c + k_-) P_n(t)
$$

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How does Polymerization Work?

- \blacktriangleright Deterministic System:
	- \blacktriangleright Motion is continuous in Space, Time
	- \triangleright Initial Condition \Rightarrow one possible trajectory
- ▶ Stochastic System:
	- \triangleright Direction of motion, Time motion occurs Random
	- \triangleright Initial Condition \Rightarrow many possible trajectories

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Stochastic System: Continuous-Time Random Walk

Number of Events in time t is modeled as a Poisson Process with rate:

$$
\blacktriangleright \lambda = k_+ c + k_-
$$

Times between Events have an Exponential Distribution with rate λ .

Probability of subtracting or adding a monomer:

$$
P(-) = \frac{k_-}{k_- + k_+ c} = \frac{k_-}{\lambda}
$$

$$
P(+) = \frac{k_+ c}{k_- + k_+ c} = \frac{k_+ c}{\lambda}
$$

 \Rightarrow Use this idea to create simulations!

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Simulation with One Polymer

Polymer Length vs Time k plus*c = 4, k minus = 1, dx = 1, L(0) = 5, tmax = 100 350 Simulation Data Trial 1 300 Simulation Data Trial 2 Simulation Data Trial 3 Simulation Data Trial 4 Simulation Data Trial 5 250 Deterministic Trajectory Polymer Length Polymer Length 200 50 100 50 $0_0^{\prime\prime}$ 0 20 40 60 80 100 Time

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Polymer Interacting with a Moving Wall

Let w be the position of the moving wall.

 \triangleright w_+ - rate that the wall moves towards the polymers

► w₋ - rate the wall moves away from the polymers Additional Constraint, if $w - x < \Delta x$:

 \blacktriangleright monomer cannot be added.

 \triangleright wall cannot move towards the polymer.

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Simulation with One Polymer and a Moving Wall

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Modeling the Gap Distance \triangleright α - rate gap distance shrinks β - rate gap distance grows $\alpha = k_{+}c + w_{+}$ $\beta = k_{-} + w_{-}$ \blacktriangleright $p(x, t)$: probability that the gap distance is x at time t \triangleright $p_t(x,t) = \alpha p(x + \Delta x,t) + \beta p(x - \Delta x,t) - (\alpha + \beta)p(x,t)$ ▶ Solve for Steady-State: $\Rightarrow p = p(x), \qquad p_t = 0$

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Model the Steady-State Gap Distance

► Discrete Space
$$
\Leftrightarrow
$$
 Random Walk
\n
$$
p_i = \frac{\alpha}{\alpha + \beta} p_{i+1} + \frac{\beta}{\alpha + \beta} p_{i-1} \qquad i > 0
$$
\n
$$
\frac{\beta}{\alpha + \beta} p_0 = \frac{\alpha}{\alpha + \beta} p_1 \qquad \text{(B.C. for i=0)}
$$

^I Continuous Space Limit ⇔ Brownian Motion $p_t = Dp_{xx} + Vp_x = 0$ $x > 0$ $Dp_x + Vp = 0$ (B.C. for x=0) $D = \lim_{\Delta x \to 0} (\alpha + \beta) \frac{(\Delta x)^2}{2}$ $\frac{\partial N}{\partial 2}$ $V = \lim_{\Delta x \to 0} (\alpha - \beta) \Delta x$

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Steady-State Gap Distance

- ^I Discrete Space ⇔ Random Walk $\Rightarrow p_i = \frac{\alpha - \beta}{\alpha}$ $\frac{-\beta}{\alpha}$ $\left(\frac{\beta}{\alpha}\right)$ $\frac{\beta}{\alpha}$ ⁱ
- ▶ Continuous Space Limit ⇔ Brownian Motion \Rightarrow $p(x) = \frac{V}{D}e^{-\frac{V}{D}x}$

Moving Wall Steady State Gap Distance

Probability

Gap Distance

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More Complicated Polymer Model

Multiple Polymers Interacting with a Moving Wall

Build upon the basic model and simulations to study a more interesting system:

 \triangleright N Polymers

Gap distances between each polymer and the wall can be modeled as an N-D biased random walk.

$$
\blacktriangleright
$$
 Special Case: $N=2$

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More Complicated Polymer Model

Multiple Polymers Interacting with a Moving Wall

- \blacktriangleright Deterministic System:
	- \triangleright Motion is continuous in Space, Time
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- \blacktriangleright Stochastic System:
	- \triangleright Direction of motion, Time motion occurs Random
	- \triangleright Initial Condition \Rightarrow many possible trajectories

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Polymer Growth Simulations

- \blacktriangleright Gillespie-type Algorithm Generates:
	- \triangleright Position of each Polymer Tip
	- \triangleright Position of the Moving Wall
- \triangleright Simulations can be used to:
	- Investigate the System
	- \triangleright Compare with Theoretical Results

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Simulation with Many Polymers

Polymer Length and Gap Distance vs Time [Introduction](#page-2-0) k_{plus} *c = 4, k_minus = 1, w_plus = 2, w_minus = 1, tmax = 10,000 Set-Up Polymer Length Polymer Length 100 **Simulations** Systems Moving Wall Polymer 1 Polymer 2 **[Materials](#page-35-0)** 50 0 20 40 60 80 100 10 9 Gap 1 8 Gap 2Gap Distance 7 Gap Distance 6 5 4 3 2 1 Ω 0 20 40 60 80 100 Time

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More Complicated Polymer Model

Multiple Polymers Interacting with a Moving Wall

 \blacktriangleright The Polymers are *Identical*:

$$
\begin{array}{ll} & k_{+}c_{p1} = k_{+}c_{p2} = k_{+}c \\ \hline & k_{-p1} = k_{-p2} = k_{-} \end{array}
$$

 \blacktriangleright Polymers do not Explicity Interact

 \blacktriangleright Are the Polymers Independent?

• Independent
$$
\Rightarrow
$$
 $p_i = \frac{\alpha - \beta}{\alpha} \left(\frac{\beta}{\alpha} \right)$

 λ ⁱ

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Steady State Gap Distribution for 2-Polymer System

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Polymer Cooperation - 2D Random Walk

Polymer Motion from Wall's POV - Gap Distances Rates of motion are given by:

(Origin represents both polymers touching the wall)

Polymer 1 Dist. from Wall

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Polymer Cooperation - 2D Random Walk

$p(x, y, t)$ - gap 1 distance is x, gap 2 distance is y, at time t

 \blacktriangleright PDE for Gap Distance Probability

$$
p_t = D_1 (p_{xx} + p_{yy}) + 2D_2 p_{xy} + V (p_x + p_y)
$$

▶ No-Flux Boundary Conditions:

$$
\blacktriangleright \ \ J_1(0,y) = D_1 p_x + D_2 p_y + V p = 0
$$

$$
\blacktriangleright \ \ J_2(x,0) = D_1 p_y + D_2 p_x + Vp = 0
$$

▶ Solve for Steady-State Solution

Polymer 1 Dist. from Wall

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Future Research

Research to be Done

- \blacktriangleright Finish analysis of 2-Polymer Model
- ▶ Generalize to N-Polymer Model
	- ► Gap Distances \Rightarrow N+1-D PDE for $p(x_1, x_2, \ldots, x_N, t)$
	- \triangleright N spatial, 1 time
- ▶ Mathematical & Biophysical Analysis of N-Polymer Model
- ▶ Study Density Function for an N-Polymer Model
	- ► Gap Distances \Rightarrow 2-D PDE for $c(x, t)$
	- \blacktriangleright 1 space, 1 time

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