Polymer Growth Simulation

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## **Polymer Growth Simulation**

Assembly Against a Force

Christine Lind

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June 2, 2005

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### Introduction

What are Molecular Motors? Conventional Molecular Motors Polymerization as a Molecular Motor

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Random Walk - Discrete Time Random Walk - Continuous Time Brownian Motion

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# What are Molecular Motors?

## Protein molecules in the cell that:

- generate force
- cause transport



Image (c) MedicalEngineer.co.uk & V F Murphy 2004

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# **Conventional Molecular Motors**

**Myosin** 

Muscle Contraction

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sarcomere

thick filament

(myosin filament)

thin filament

(actin filament)

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# **Conventional Molecular Motors**

**Kinesin** 

Intracellular Transport

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# **Conventional Molecular Motors**



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# Polymerization as a Motor

Another way to cause motion/transport

(adding or subtracting monomers)

POLYMERIZATION-or-DEPOLYMERIZATION !

monomer

Polymerization

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# Polymerization as a Motor - Biological Examples

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# Polymerization as a Motor - Biological Examples

Sickle Hemoglobin Polymerization creates Sickle Cells:

**Cell Membrane Deformation** 

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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 Note:

Adding/Subtracting monomers may actually require ATP hydrolysis, but this will not be included in our model.



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# Polymerization as a Random Walk - Discrete Time

### **Random Walk Model**

 $\Delta x$  - width of each monomer  $\Delta t$  - size of discrete time step l(t) - length of the polymer  $l(0) = m\Delta x$  - initial polymer has *m* monomers If l(t) reaches zero, then the polymer is gone, and can no longer grow or shrink.



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# Polymerization as a Random Walk - Discrete Time

## Random Walk Model

At each time step either:

- Add one monomer with probability  $k_+ c \Delta t$
- Subtract one monomer with probability  $k_-\Delta t$

Then  $l(t + \Delta t) = l(t) \pm \Delta x$ .

### Note:

Let  $\Delta t = \frac{1}{k_{-}+k_{+}c}$  so that the total probability at each time step is one:

$$P(-) + P(+) = \frac{k_{-}}{k_{-} + k_{+}c} + \frac{k_{+}c}{k_{-} + k_{+}c} = \frac{k_{-} + k_{+}c}{k_{-} + k_{+}c} = 1$$

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# Polymerization as a Random Walk - Discrete Time

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# **Random Walk - Discrete Time Simulation**

## **Simulation Procedure**

Let  $num_{-} = k_{-}\Delta t$ At each time step, generate u, a uniform(0,1) random number:

Table: Algorithm for deciding which event occurs.

Condition	Action
$0 \leq u < num_{-}$	subtract a monomer
$\mathit{num}_{-} \leq \mathit{u} \leq 1$	add a monomer



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## **Random Walk - Discrete Time Simulation**

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# Polymerization as a Random Walk -Continuous Time

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### Random Walk Model with Continuous Time

- Discrete Time Model is not very realistic. Assume that:
  - 1. Adding or Subtracting events are independent
  - 2. In a small amount of time dt:
    - $P_{\text{one event}}(dt) = \lambda dt + o(dt)$
    - $P_{\text{no events}}(dt) = 1 \lambda dt + o(dt)$
- Number of Events in time t is modeled as a Poisson Process!
  - Rate:  $\lambda = k_{-} + k_{+}c_{-}$
- $\Delta t$  is now random

Inter-arrival times have exponential(rate=λ) distribution



# Polymerization as a Random Walk -Continuous Time

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## Random Walk Model with Continuous Time

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  - 1. Adding or Subtracting events are independent
  - 2. In a small amount of time dt:

• 
$$P_{\text{one event}}(dt) = \lambda dt + o(dt)$$

• 
$$P_{\text{no events}}(dt) = 1 - \lambda dt + o(dt)$$

Number of Events in time t is modeled as a Poisson Process!

• Rate: 
$$\lambda = k_- + k_+ c$$

•  $\Delta t$  is now random

Inter-arrival times have exponential(rate=λ) distribution



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## Random Walk Model with Continuous Time

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  - 1. Adding or Subtracting events are independent
  - 2. In a small amount of time dt:

• 
$$P_{\text{one event}}(dt) = \lambda dt + o(dt)$$

• 
$$P_{\text{no events}}(dt) = 1 - \lambda dt + o(dt)$$

Number of Events in time t is modeled as a Poisson Process!

• Rate: 
$$\lambda = k_- + k_+ c$$

- Δt is now random
  - Inter-arrival times have exponential(rate= $\lambda$ ) distribution



# **Continuous Time Simulation**

### **Poisson Process**

Has density function

$$P(N(t) = k) = \frac{(\lambda t)^k}{k!}e^{-\lambda t}$$

- Often used to describe the number of events that occur in an amount of time t.
- Time between events,  $\tau$ , given by exponential(rate= $\lambda$ ):

$$P\left(\tau=t\right)=\lambda e^{-\lambda t}$$



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Generation of an Exponential from a Uniform

Let U be a uniform(0,1) random variable, and  $\frac{1}{\lambda} > 0$ , then

$$X=-rac{1}{\lambda}\log U$$

is an exponential(rate= $\lambda$ ) random variable



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### **Simulation Set-up**

Let the following formulas hold:

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

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

• 
$$num_{-} = \frac{k_{-}}{\lambda}$$

Note that the total probability is still one:

$$P(-) + P(+) = rac{k_-}{\lambda} + rac{k_+c}{\lambda} = rac{k_- + k_+c}{k_- + k_+c} = 1$$



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## **Simulation Procedure**

For each event-time pair:

- **1.** Generate two uniform(0,1) random numbers,  $u_1, u_2$ .
- 2. Use  $u_1$  to generate the interarrival time,  $\tau$ , for the event using  $\tau = -\frac{1}{\lambda} \log u_1$ .
- Use u<sub>2</sub> to decide whether the event will be addition or subtraction:
  - If  $0 \le u_2 < num_-$  then subtract a monomer.
  - If  $num_{-} \leq u_2 \leq 1$  then add a monomer.
- 4. Record the *i*<sup>th</sup> event time  $t_i = t_{i-1} + \tau$  and the location of the end of the polymer  $x_i = x_{i-1} \pm \Delta x$ , where  $\pm$  is determined by Step 3.

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## **Random Walk - Brownian Motion Connection**

Let  $\alpha = k_+c$ ,  $\beta = k_-$ . p(x, t):probability that the polymer has length x at time t (continuous time)

$$\triangleright p_t(x,t) = \alpha p(x - \Delta x, t) + \beta p(x + \Delta x, t) - (\alpha + \beta) p(x, t)$$

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### **Random Walk - Brownian Motion Connection**

Taylor Expansion & Some Algebra:

$$p_t(x,t) = (\alpha + \beta) \frac{(\Delta x)^2}{2} p_{xx}(x,t) - (\alpha - \beta) \Delta x p_x(x,t)$$

+ higher order terms in  $\Delta x$ 

• Let  $\Delta x \rightarrow 0$ :

$$\lim_{\Delta x \to 0} (\alpha + \beta) \frac{(\Delta x)^2}{2} = D \qquad \lim_{\Delta x \to 0} (\alpha - \beta) \Delta x = V$$

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### **Random Walk - Brownian Motion Connection**

Taylor Expansion & Some Algebra:

$$p_t(x,t) = (\alpha + \beta) \frac{(\Delta x)^2}{2} p_{xx}(x,t) - (\alpha - \beta) \Delta x p_x(x,t)$$

+ higher order terms in  $\Delta x$ 

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## Random Walk - Brownian Motion Connection

Then we obtain

$$p_t(x,t) = Dp_{xx}(x,t) - Vp_x(x,t)$$

- The Diffusion Equation with Drift!
- Will allow us to answer more questions later...

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## Polymer Interacting with a Fixed Wall

Let x = w be the position of the fixed wall. Polymer (and Simulation) behaves as before, but with additional constraints:

• If  $w - x < \Delta x$  then a monomer cannot be added.

If a monomer is to be added and w − x < ∆x, then polymer length remains the same at that time.



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## **Gap Distribution**

We can also model the gap distance using the diffusion equation with drift:

$$\triangleright p_t = Dp_{xx} + Vp_x$$

$$D = (k_+c + k_-)$$
  $V = (k_+c - k_-)$ 

Note that the sign on V is different than before.We can solve for the steady state solution



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## Steady State Gap Distribution - Brownian Motion

 $0 = Du_{xx} + Vu_x$ Need two conditions:

No-Flux Boundary Condition at x=0:

$$Du_x + Vu = 0$$

Normalization:

$$\int_0^\infty u(x)dx = 1$$

Steady-State Solution:

$$u(x) = \frac{V}{D}e^{-\frac{V}{D}x}$$

Note: This model is spatially continuous system...

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## Steady State Gap Distribution - Brownian Motion

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**Steady State Gap Distribution - Brownian Motion** Let  $p_i$  denote the probability that the gap distance is *i*:

$$\alpha = \frac{k_+ c}{k_+ c + k_-} \qquad \beta = \frac{k_-}{k_+ c + k_-}$$

 $\triangleright p_i = \alpha p_{i+1} + \beta p_{i-1}$ 



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Steady State Gap Distribution - Random Walk

Let  $p_i = \mu^i$ :

$$\blacktriangleright \ \mu = \alpha \mu^2 + \beta$$

• Quadratic Equation &  $\alpha + \beta = 1$ :

$$\mu_1 = 1, \qquad \mu_2 = \frac{\beta}{\alpha}$$

Then we know that the system must be of the form

$$p_i = a \left(\frac{\beta}{\alpha}\right)^i + b$$

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Steady State Gap Distribution - Random Walk

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**Steady State Gap Distribution - Random Walk** We can apply the normalization condition:

$$\sum_{i=0}^{\infty} p_i = \sum_{i=0}^{\infty} (a \left(rac{eta}{lpha}
ight)^i + b) = 1$$

• The sum must converge, so b = 0

▶ We are left with a geometric series:

$$a\sum_{i=0}^{\infty} \left(\frac{\beta}{\alpha}\right)^{i} = a\frac{1}{1-\frac{\beta}{\alpha}} = 1$$

Spatially Discrete Steady State Solution:

$$p_i = \frac{\alpha - \beta}{\alpha} \left(\frac{\beta}{\alpha}\right)'$$

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**Steady State Gap Distribution - Random Walk** We can apply the normalization condition:

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## Wall Moves According to a Random Walk

 $w_+$  - rate that the wall moves towards the polymer  $w_-$  - rate the wall moves away from the polymer

g - gap distance  $\lambda_p = k_+c + k_-$  - Poisson Process rate for the polymer  $\lambda_w = w_+ + w_-$  - Poisson Process rate for the wall



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## Polymer Interacting with a Moving Wall

# Polymer and Wall both follow random walks with constraints:

- If g < ∆x then a monomer cannot be added and the wall cannot move towards the polymer.</p>
- If a monomer is to be added (wall is to move towards the polymer) and g < ∆x, then polymer length (wall position) remains the same at that time.



#### Polymer Growth Simulation

**Christine Lind** 

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**Steady State Gap Distribution** - **Random Walk** Let *p<sub>i</sub>* denote the probability that the gap distance is *i*, and let

$$\alpha_{p} = \frac{k_{+}c}{k_{+}c_{+}k_{-}+w_{+}w_{-}} \qquad \beta_{p} = \frac{k_{-}}{k_{+}c_{+}k_{-}+w_{+}w_{-}} \alpha_{w} = \frac{w_{+}}{k_{+}c_{+}k_{-}+w_{+}w_{-}} \qquad \beta_{w} = \frac{w_{-}}{k_{+}c_{+}k_{-}+w_{+}w_{-}}$$

 $\triangleright p_i = (\alpha_p + \alpha_w)p_{i+1} + (\beta_p + \beta_w)p_{i-1}$ 

(There are now 2 ways that gap distance can change)



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**Steady State Gap Distribution - Random Walk** Let *p<sub>i</sub>* denote the probability that the gap distance is *i*, and let

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Steady State Gap Distribution - Random Walk

Let  $\alpha = \alpha_p + \alpha_w$ , and  $\beta = \beta_p + \beta_w$ Then we can see that

$$p_i = (\alpha_p + \alpha_w)p_{i+1} + (\beta_p + \beta_w)p_{i-1}$$
$$= \alpha_{p_{i+1}} + \beta_{p_{i-1}}$$

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This is exactly the same equation we had before!

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## Steady State Gap Distribution - Random Walk

We already know the Steady State Distribution:

$$p_i = \frac{\alpha - \beta}{\alpha} \left(\frac{\beta}{\alpha}\right)^i$$

where:

$$\alpha = (\mathbf{k}_{+}\mathbf{c} + \mathbf{w}_{+}) \qquad \beta = (\mathbf{k}_{-} + \mathbf{w}_{-})$$

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## Multiple Polymers Interacting with a Moving Wall

 $w_+$  - rate that the wall moves towards the polymers  $w_-$  - rate the wall moves away from the polymers

 $\lambda_p = k_+ c + k_-$  - Poisson Process rate for each polymer  $\lambda_w = w_+ + w_-$  - Poisson Process rate for the wall



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Polymer Length and Gap Distance vs Time k\_plus\*c = 4, k\_minus = 1, w\_plus = 2, w\_minus = 1, tmax = 10,000 Polymer Length 100 Moving Wall Polymer 1 Polymer 2 50 -20 40 60 80 100 10 9 Gap 1 8 Gap 2 Gap Distance 6 5 3 2 0 20 40 60 80 100 Time

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## Multiple Polymers Interacting with a Moving Wall

► The Polymers are *Identical*:

► 
$$k_+c_{p1} = k_+c_{p2} = k_+c$$
  
►  $k_-p_1 = k_-p_2 = k_-$ 

## Are the Polymers Independent?



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## Multiple Polymers Interacting with a Moving Wall

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$$k_+c_{p1} = k_+c_{p2} = k_+c_{p2}$$

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## Are the Polymers Independent?



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## Multiple Polymers Interacting with a Moving Wall

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## Are the Polymers Independent?



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## Multiple Polymers Interacting with a Moving Wall If the Polymers are *Independent*:

Steady State Distribution for each Polymer should be the same as in the Single-Polymer Case:

$$p_{1_i} = p_{2_i} = \frac{\alpha - \beta}{\alpha} \left( \frac{\beta}{\alpha} \right)$$

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# Multiple Polymers Interacting with a Moving Wall

If the Polymers are Independent:

Steady State Distribution for each Polymer should be the same as in the Single-Polymer Case:

$$p_{1_i} = p_{2_i} = \frac{\alpha - \beta}{\alpha} \left(\frac{\beta}{\alpha}\right)$$

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## **Polymer Cooperation**

Polymers are not Independent  $\Rightarrow$  Cooperation! How? (Mathematically)

 Look at the Polymers from the Point of View of the Wall.



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## **Polymer Cooperation**

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## Polymer Cooperation - 2D Random Walk

## Polymer Motion from Wall's POV - Gap Distances

Rates of motion are given by:

polymer moves	wall moves	
$\alpha_p$ - towards wall	$\alpha_w$ - towards polymer	
$\beta_{p}$ - away from wall	$\beta_w$ - away from polymer	

(Origin represents both polymers touching the 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

$$p_t(x, y, t) = \alpha_p \left( p(x + \Delta x, y, t) + p(x, y + \Delta y, t) \right) + \beta_p \left( p(x - \Delta x, y, t) + p(x, y - \Delta y, t) \right) + \alpha_w p(x + \Delta x, y + \Delta y, t) + \beta_w p(x - \Delta x, y - \Delta y, t) - \left( 2\alpha_p + 2\beta_p + \alpha_w + \beta_w \right) p(x, y, t)$$

 $\Rightarrow \mathsf{PDE...}$ 

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## **Polymer Cooperation - Another View**

## **Smallest Cycle**

Net Motion	Physical Result	Condition
Clockwise	polymer pushes wall	$\gamma > 1$
Counterclockwise	wall pushes polymer	$\gamma < 1$
None	balance	$\gamma = 1$

$$\gamma = \frac{\beta_w \alpha_p^2}{\alpha_w \beta_p^2}$$



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## **Polymer Cooperation - Another View**

**Smallest Cycle** 

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$$\log \gamma = \log \frac{\beta_w \alpha_p^2}{\alpha_w \beta_p^2} = \log \left(\frac{\alpha_p}{\beta_p}\right)^2 - \log \frac{\alpha_w}{\beta_w}$$
$$= 2\log \frac{\alpha_p}{\beta_p} - \log \frac{\alpha_w}{\beta_w}$$



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# **Polymer Cooperation - Another View**

### **Smallest Cycle - Force Connection**

Net Motion	Physical Result	Condition
Clockwise	polymer pushes wall	$\log\gamma > 0$
Counterclockwise	wall pushes polymer	$\log\gamma < 0$
None	balance	$\log\gamma=0$

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$$\frac{k_B T}{\Delta x} \log \gamma = \frac{k_B T}{\Delta x} \left( 2 \log \frac{\alpha_p}{\beta_p} - \log \frac{\alpha_w}{\beta_w} \right)$$
  
Net Force = Force of 2 Polymers – Force of Wall



# The End

## **Questions?**



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