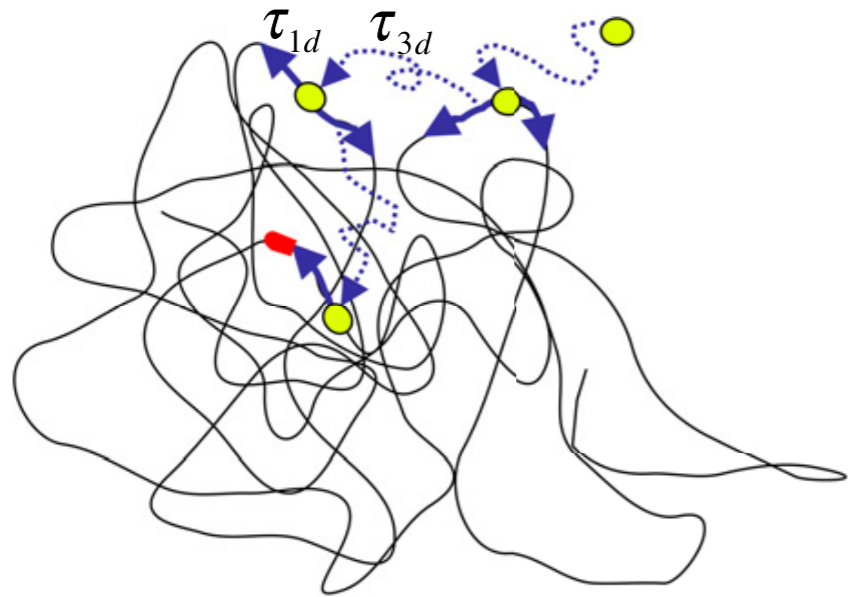
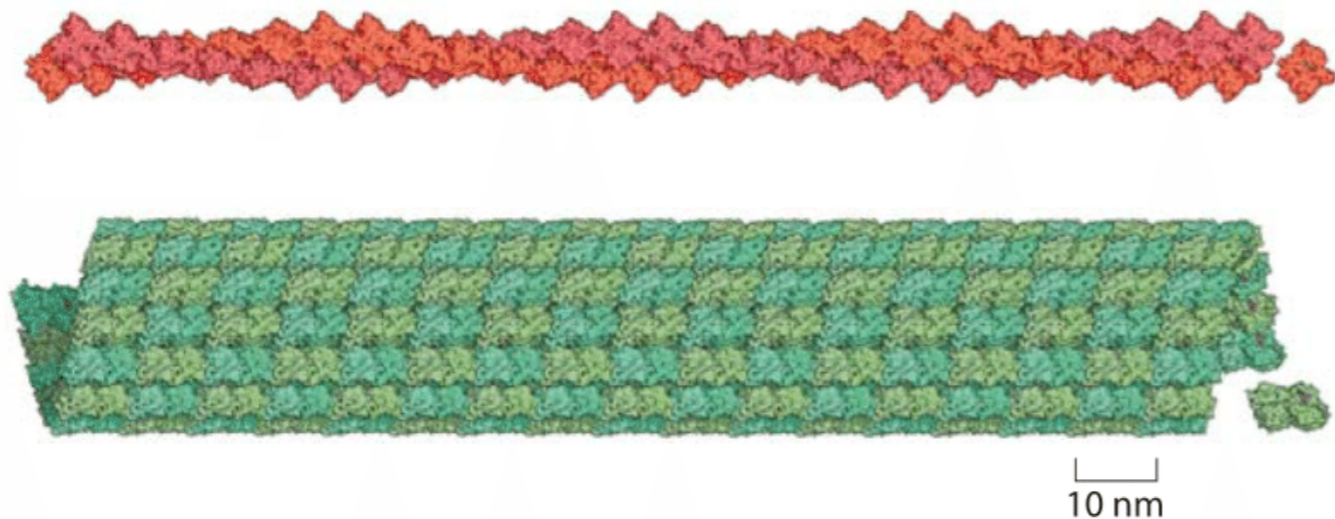


# How proteins find target sites on DNA?



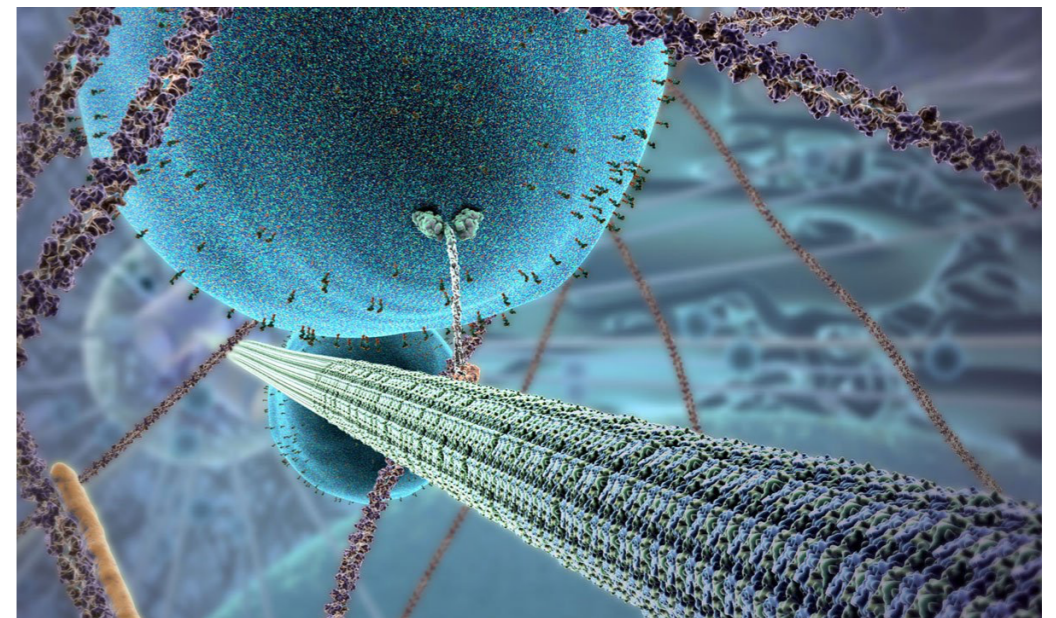
# Growth dynamics of actin filaments and microtubules



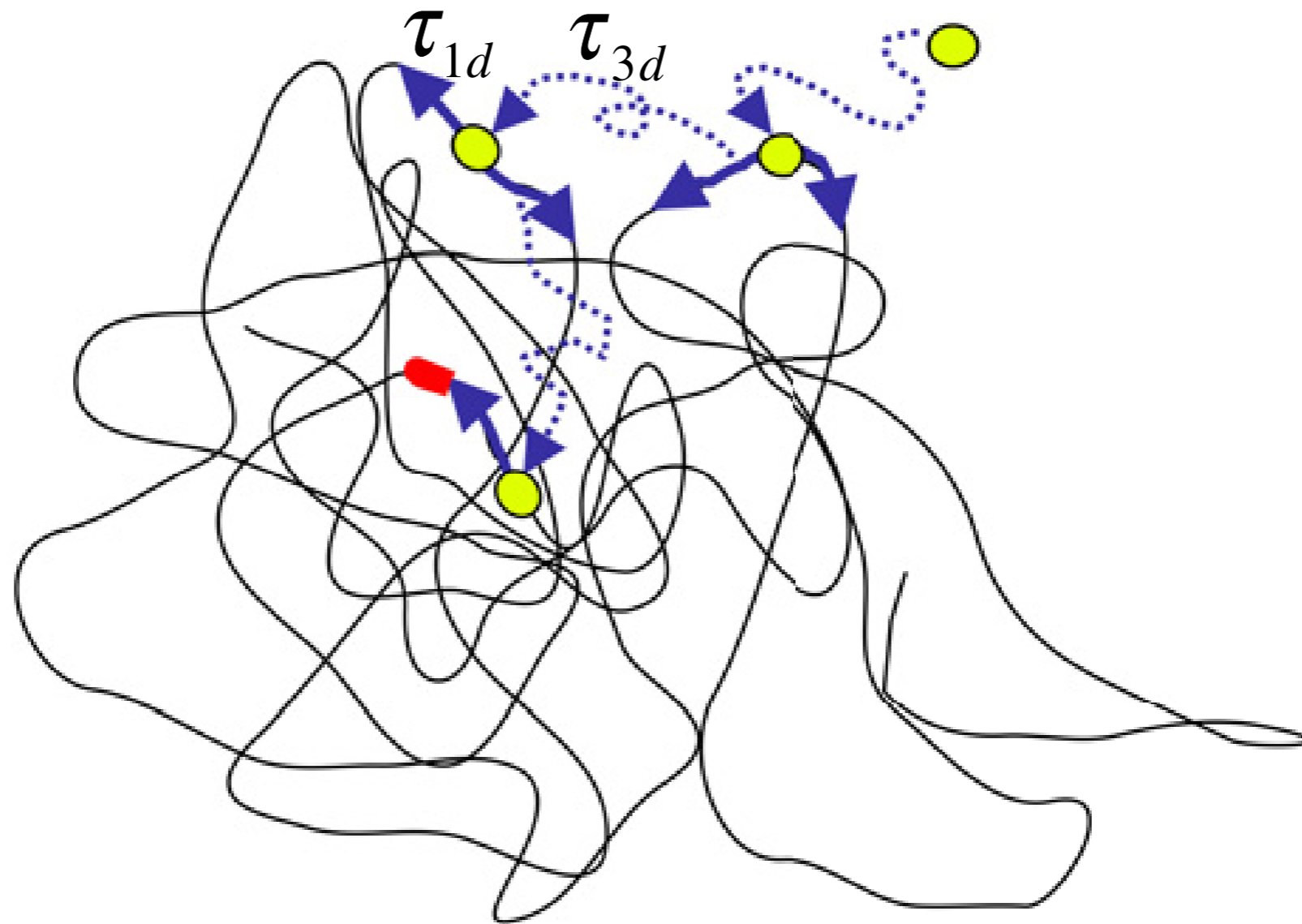
# Statistical mechanics of polymers



# Dynamics of molecular motors

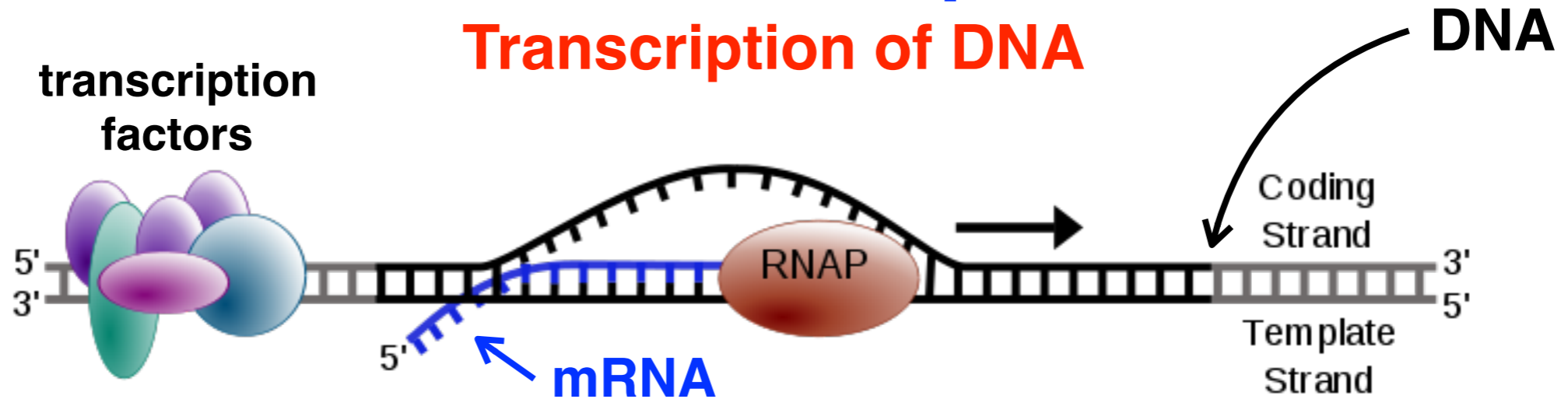


# How proteins find target sites on DNA?



# Production of new proteins

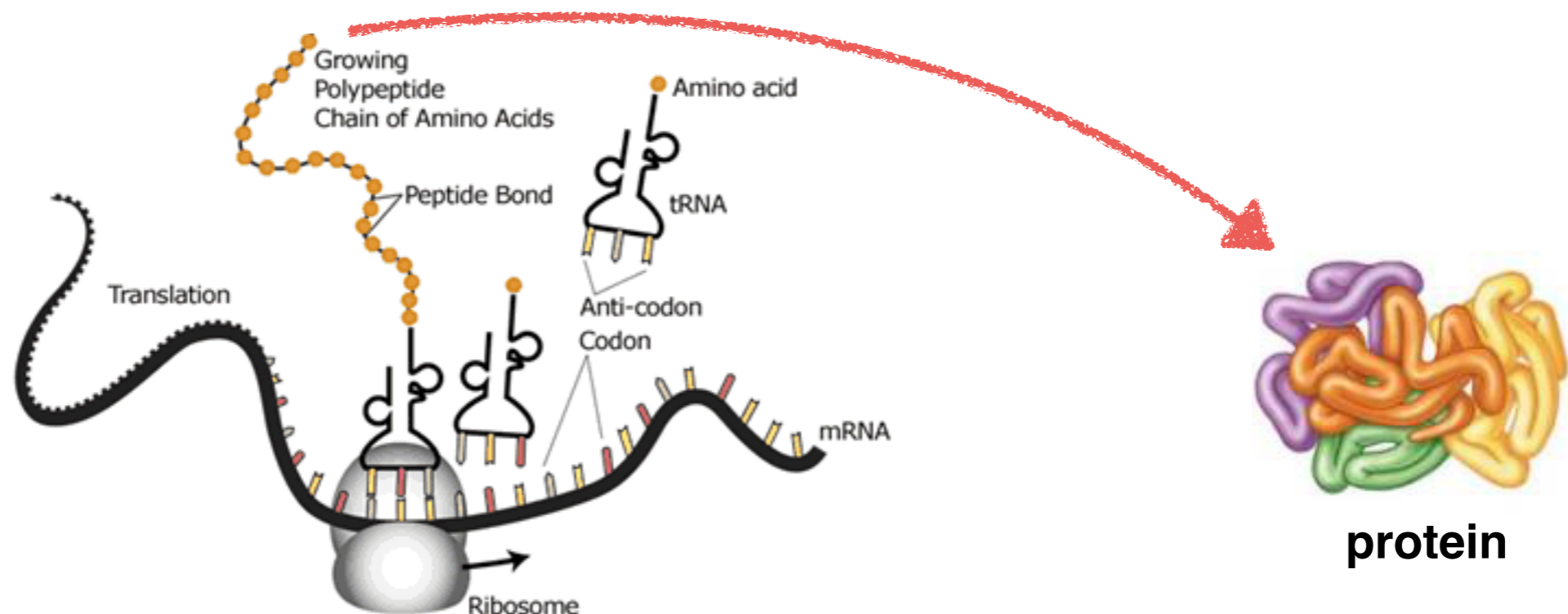
## Transcription of DNA



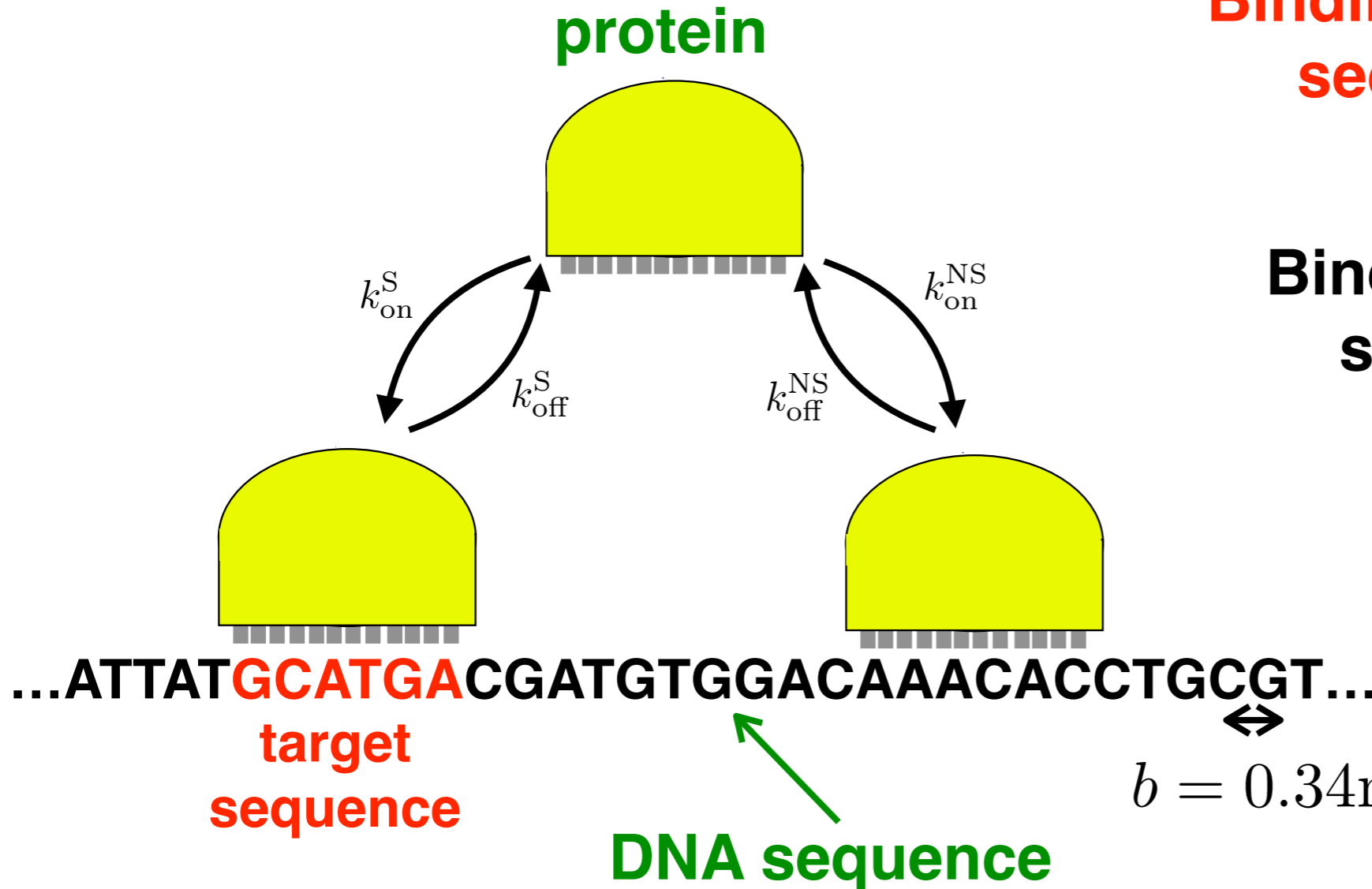
Transcription factors are proteins, which bind to specific locations on DNA, and they help recruiting RNA polymerase (RNAP) that makes a messenger RNA (mRNA) copy of certain DNA segment.

Note: some transcription factors (repressors) also prevent transcription.

## Translation of mRNA



# Protein-DNA interactions



**Binding to specific target sequence is strong**

$$\Delta G^S \sim 20 - 25k_B T$$

**Binding to nonspecific sequence is weak**

$$\Delta G^{\text{NS}} \sim 5 - 10k_B T$$

(Binding free energies can be modified by changing salt concentration, etc.)

**on rates are diffusion limited**

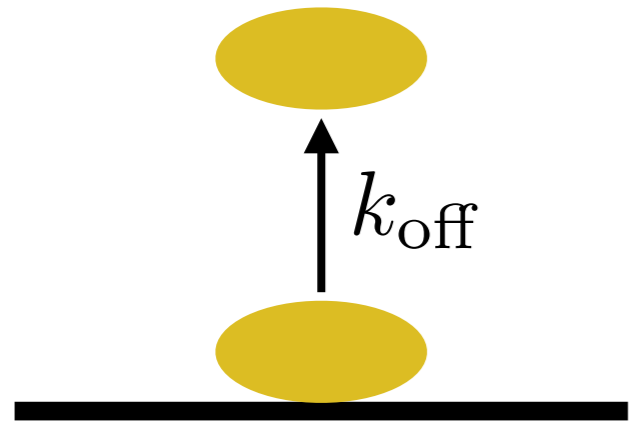
$$k_{\text{on}}^S \approx k_{\text{on}}^{\text{NS}} \approx 4\pi D_3 b$$

**off rates depend on binding strengths**

$$k_{\text{off}}^S = A_s e^{-\Delta G^S / k_B T} \ll k_{\text{off}}^{\text{NS}} = A_s e^{-\Delta G^{\text{NS}} / k_B T}$$

$$\frac{k_{\text{off}}^S}{k_{\text{off}}^{\text{NS}}} \sim 10^{-6}$$

# How long proteins remain bound on DNA?



Probability that protein unbinds in a small time interval  $\Delta t$  :

$$k_{\text{off}}\Delta t$$

Probability that protein remains bound for time  $t$  and then it unbinds between time  $t$  and  $t + \Delta t$  :

$$k_{\text{off}}\Delta t \times (1 - k_{\text{off}}\Delta t)^{t/\Delta t}$$

limit  $\Delta t \rightarrow 0$

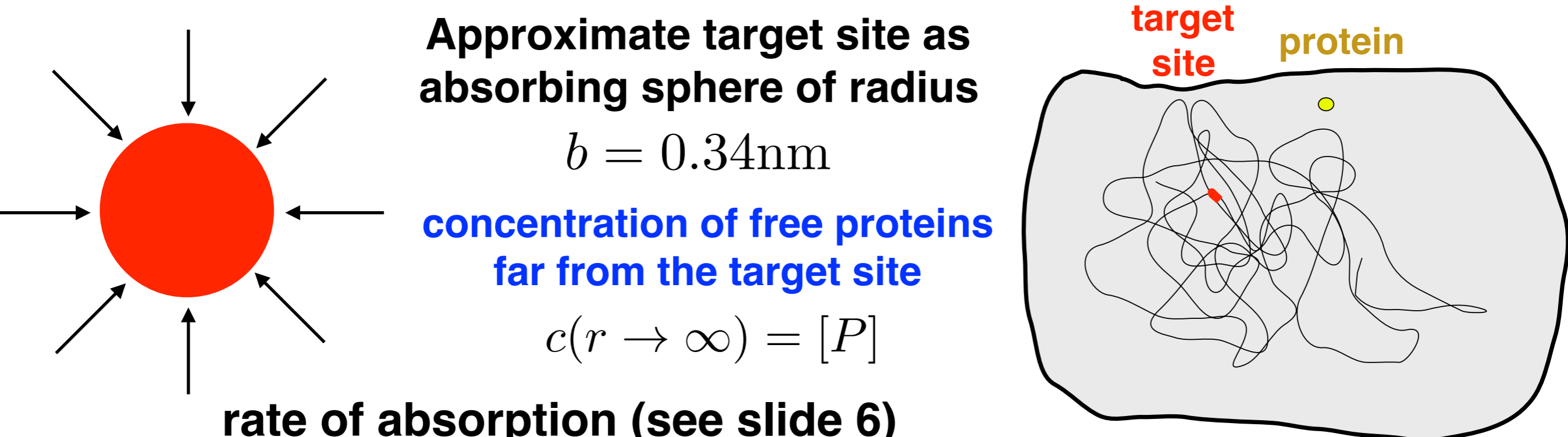
$$p(t) = k_{\text{off}}e^{-k_{\text{off}}t}$$

Average binding time  $\langle t \rangle = \int_0^{\infty} t p(t) dt = \frac{1}{k_{\text{off}}}$

Proteins remain bound to specific target sites for minutes to hours, while they unbind from nonspecific sites after milliseconds to seconds.

# How quickly proteins find target sites on DNA?

## Characteristic search time via 3D diffusion



Approximate target site as absorbing sphere of radius  $b = 0.34\text{nm}$

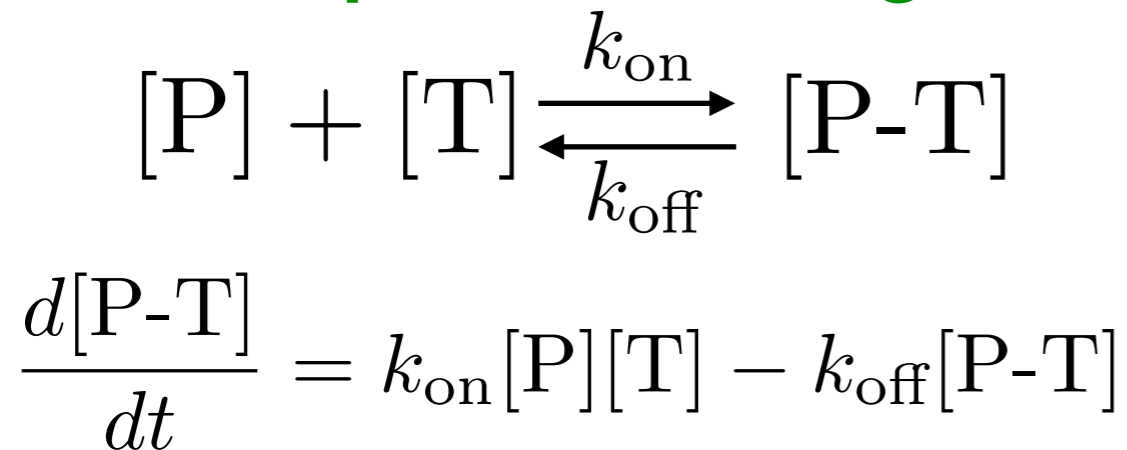
concentration of free proteins far from the target site  $c(r \rightarrow \infty) = [P]$

rate of absorption (see slide 6)

$$I_0 = 4\pi D_3 b [P] \equiv k_{\text{on}} [P]$$

$k_{\text{on}} = 4\pi D_3 b$

## Kinetics of protein binding/unbinding



short time binding kinetics for initially empty target sites  $[P-T]=0$

$$\frac{d[P-T]}{dt} = (k_{\text{on}} [T]) [P] \equiv \frac{[P]}{t_s}$$

characteristic search time

$$t_s = (k_{\text{on}} [T])^{-1}$$

$[P-T]$  concentration of proteins bound to target sites

$[P]$  concentration of free proteins

$[T]$  concentration of empty target sites

# How quickly proteins find target sites on DNA?

## Characteristic search time via 3D diffusion

$$k_{\text{on}} = 4\pi D_3 b \quad t_s = (k_{\text{on}} [\text{T}])^{-1}$$

### 1917 Smoluchowski theory

### Example: characteristic search time for lac repressor protein in E. coli

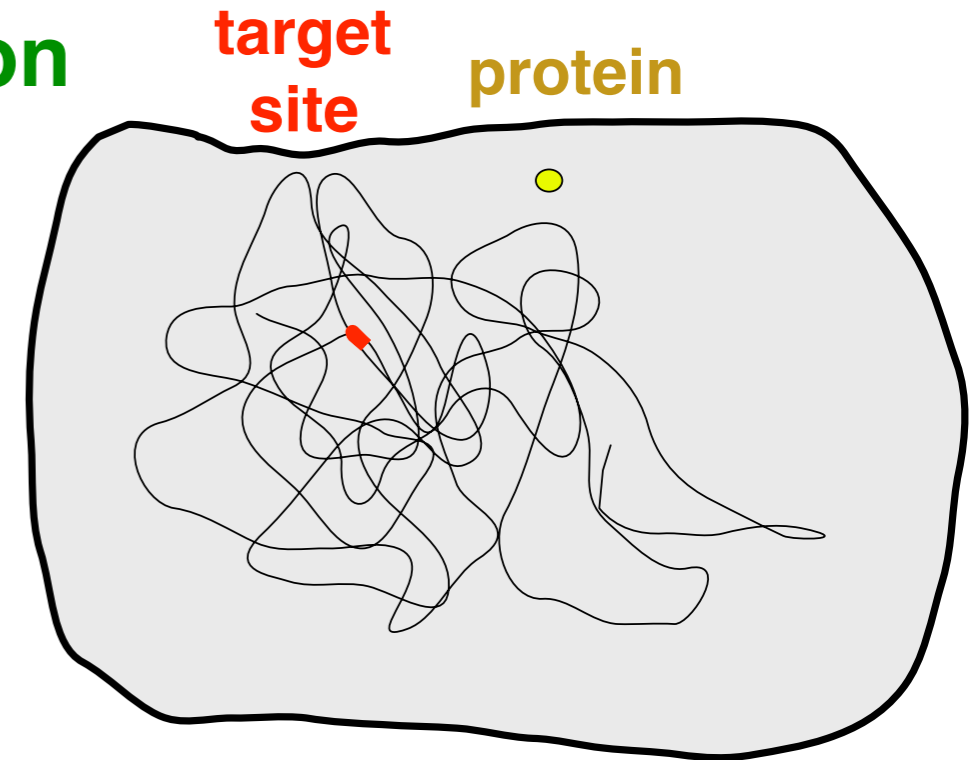
$$b \approx 0.34 \text{ nm} \quad D_3 \approx 30 \mu\text{m}^2/\text{s}$$

$$[\text{T}] \sim 1 \text{ per cell} \sim 10^{-9} \text{ M}$$

$$k_{\text{on}} \sim 10^8 \text{ M}^{-1} \text{ s}^{-1} \quad t_s \sim 10 \text{ s}$$

### in vitro experiments (1970)

$$k_{\text{on}}^{\text{exp}} \sim 10^{10} \text{ M}^{-1} \text{ s}^{-1} \quad t_s \sim 0.1 \text{ s}$$



### Molar concentration

$$1 \text{ M} = 6 \times 10^{26} \text{ m}^{-3}$$

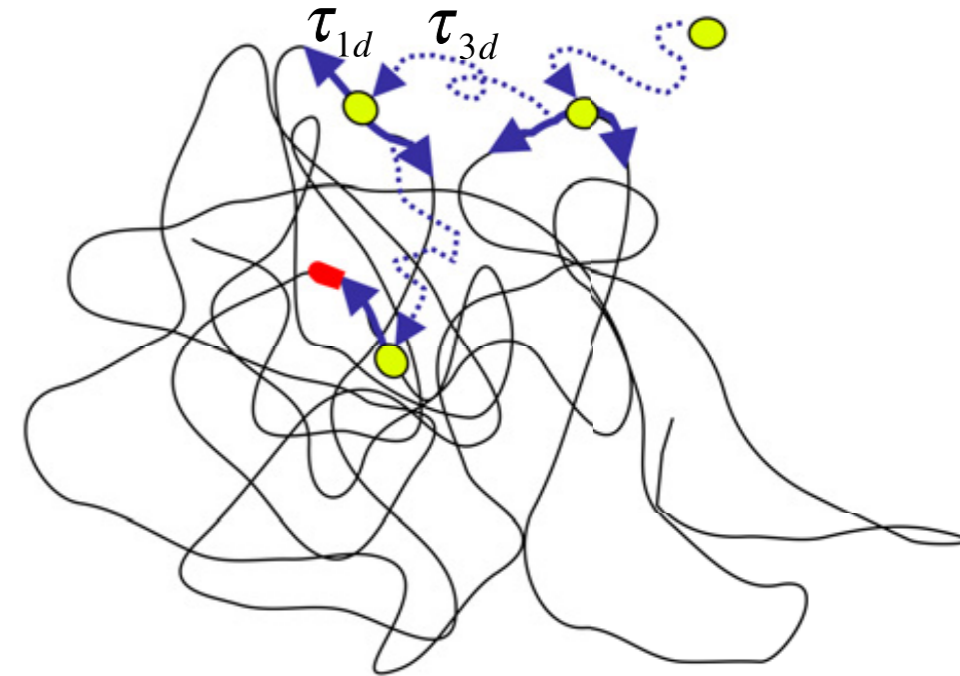
A.D. Riggs *et al.*,  
J. Mol. Biol. **53**, 401-417 (1970)

## Why is experimentally observed rate 100 times larger?

# Berg - von Hippel theory (1980s)

**(facilitated diffusion)**

- 1. Proteins diffuse in space and non-specifically bind to a random location on DNA.**
- 2. Proteins slide (diffuse) along the DNA.**
- 3. Proteins jump (diffuse) to another random location on DNA and continue this sliding/jumping process until the target site is found.**



$b = 0.34\text{nm}$   $L$  - DNA length

$D_3$  - diffusion constant in space

$D_1$  - diffusion constant along the DNA

**How long that is it take to find a target site in this process?**



# Berg - von Hippel theory (1980s)

First assume fixed sliding time  $\tau_{1d}$

Number of distinct sites visited during each sliding event

$$n = \sqrt{16D_1\tau_{1d}/(\pi b^2)}$$

(valid for  $n \gg 1$ )

Probability that target site is found during a sliding event

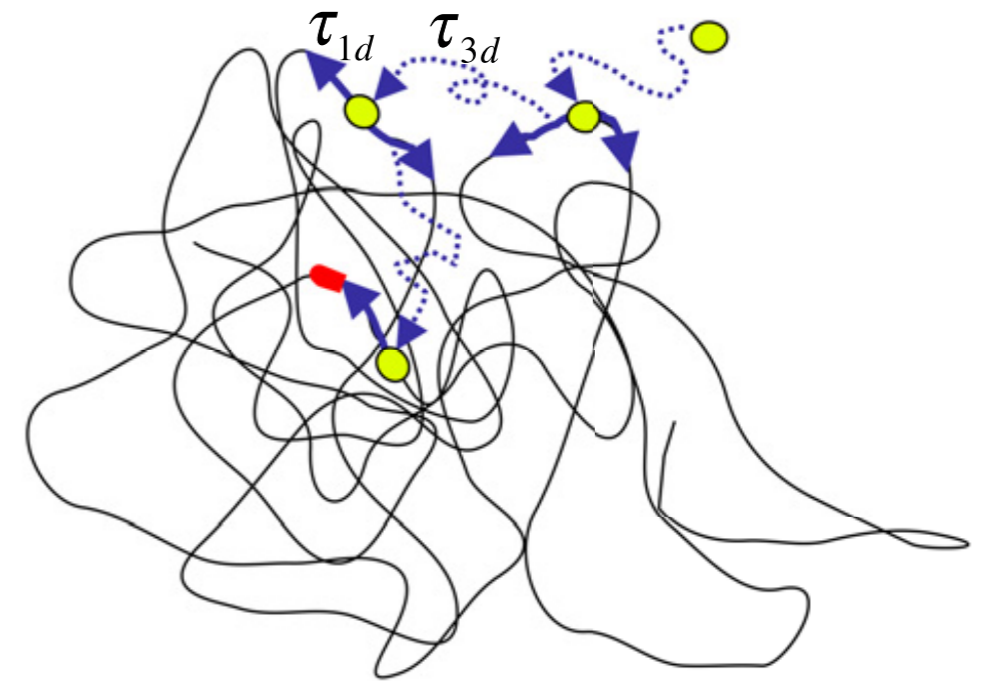
$$q = nb/L$$

Probability that target site is found exactly after  $N_R$  rounds

$$p(N_R) = q(1 - q)^{N_R - 1}$$

Average number of rounds needed to find the target

$$\overline{N_R} = \sum_{N_R=1}^{\infty} N_R p(N_R) = 1/q$$



$b = 0.34\text{nm}$   $L$  - DNA length

$D_3$  - diffusion constant in space

$D_1$  - diffusion constant along the DNA

$\tau_{3d}$  - characteristic jumping time

**Average search time**

$$\overline{t_s} = \overline{N_R} (\tau_{1d} + \tau_{3d})$$

O.G.Berg et al.,

Biochemistry **20**, 6929-48 (1981)

# Facilitated diffusion

In reality sliding times are exponentially distributed

$$p(\tau_{1d}) = k_{\text{off}}^{\text{NS}} e^{-k_{\text{off}}^{\text{NS}} \tau_{1d}}$$

$$\langle \tau_{1d} \rangle = \int_0^{\infty} d\tau_{1d} \tau_{1d} p(\tau_{1d}) = 1/k_{\text{off}}^{\text{NS}}$$

Average number of distinct sites visited during each sliding

$$\langle n \rangle = \int_0^{\infty} d\tau_{1d} p(\tau_{1d}) \sqrt{16D_1\tau_{1d}/(\pi b^2)}$$

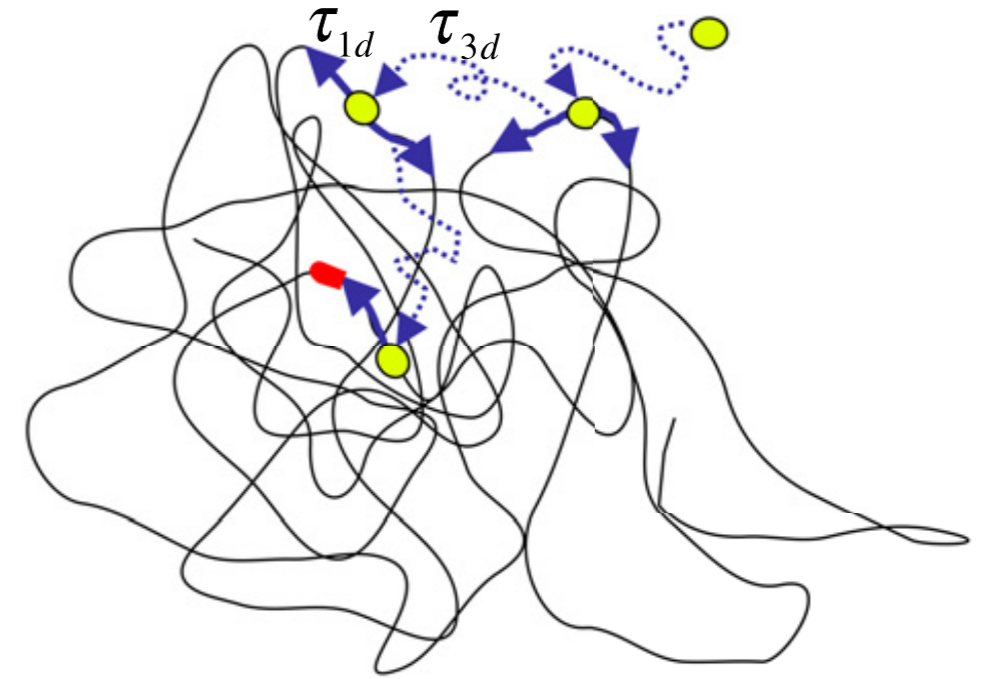
$$\langle n \rangle = 2\sqrt{D_1 \langle \tau_{1d} \rangle / (b^2)}$$

Average probability that target site is found during a sliding event

$$\langle q \rangle = \langle n \rangle b/L$$

Average number of rounds  $N_R$  needed to find the target site

$$\overline{\langle N_R \rangle} = 1/\langle q \rangle$$



$b = 0.34\text{nm}$   $L$  - DNA length

$D_3$  - diffusion constant in space

$D_1$  - diffusion constant along the DNA

$\tau_{3d}$  - characteristic jumping time

**Average search time**

$$\overline{\langle t_s \rangle} = \overline{\langle N_R \rangle} (\langle \tau_{1d} \rangle + \tau_{3d})$$

$$\overline{\langle t_s \rangle} = \frac{L}{2\sqrt{D_1 \langle \tau_{1d} \rangle}} (\langle \tau_{1d} \rangle + \tau_{3d})$$

# Facilitated diffusion

**Average search time**  $\overline{\langle t_s \rangle} = \frac{L}{\langle \ell_{sl} \rangle} (\langle \tau_{1d} \rangle + \tau_{3d})$

**Average sliding length**  $\langle \ell_{sl} \rangle = 2\sqrt{D_1 \langle \tau_{1d} \rangle}$

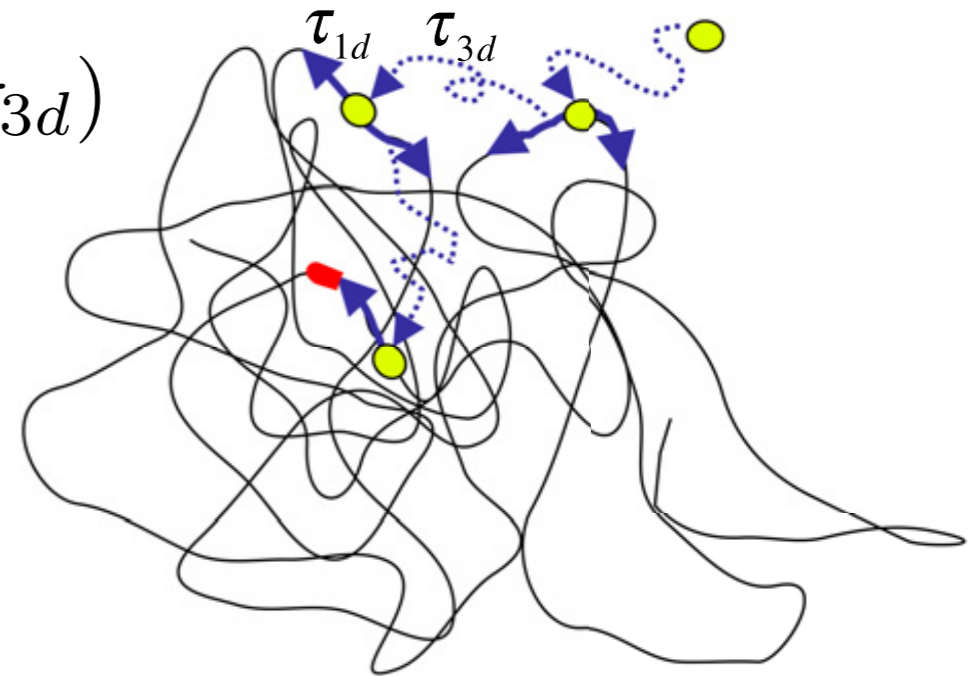
## Optimal search time

$$\frac{d\overline{\langle t_s \rangle}}{d\langle \tau_{1d} \rangle} = 0$$



$$\langle \tau_{1d} \rangle_{\text{opt}} = \tau_{3d}$$

$$\overline{\langle t_s \rangle}_{\text{opt}} = L \sqrt{\frac{\tau_{3d}}{D_1}}$$



$b = 0.34\text{nm}$   $L$  - DNA length  
 $D_3$  - diffusion constant in space  
 $D_1$  - diffusion constant along the DNA

## Search time for jumps alone

**Typical jump time**  $\tau_{3d} = \frac{1}{k_{\text{on}} [\text{NS}]} = \frac{V}{4\pi D_3 L}$

**Concentration of non-specific sites**  $[\text{NS}] = \frac{L/b}{V}$

**average number of jumps needed to find the target**  $\overline{N}_{\text{jumps}} = \frac{L}{b}$

$$\overline{t_{s,\text{jumps}}} = \overline{N}_{\text{jumps}} \tau_{3d} = \frac{V}{4\pi D_3 b}$$

## Search time for sliding alone

$$\langle t_s \rangle_{\text{sliding}} \sim \frac{L^2}{D_1}$$

**Search time speed up for facilitated diffusion**

$$\frac{\overline{t_{s,\text{jumps}}}}{\overline{\langle t_s \rangle}} = \frac{\langle \ell_{sl} \rangle}{b} \frac{\tau_{3d}}{(\langle \tau_{1d} \rangle + \tau_{3d})}$$

# Example: search time for target site in bacteria on DNA with $10^6$ base pairs

$$\tau_{3d} = 10^{-4} \text{ s}$$

$$D_1 = 0.05 \mu\text{m}^2/\text{s}$$

$$L = 1 \text{ mm}$$

$$b = 0.34 \text{ nm}$$

**search time for jumps alone**

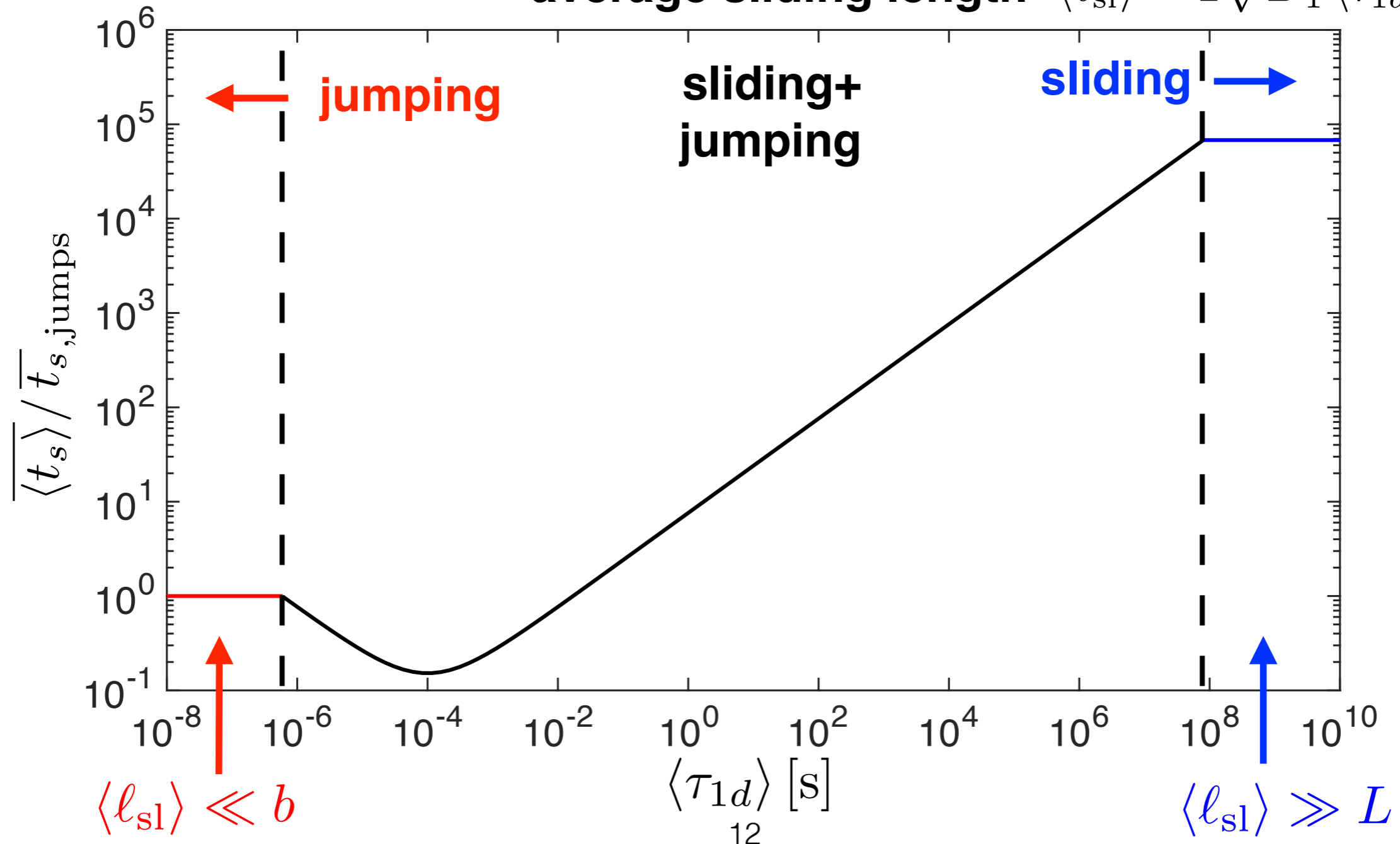
$$\overline{t_{s,\text{jumps}}} = (L/b)\tau_{3d} \approx 300 \text{ s}$$

**average search time**

$$\langle t_s \rangle = \frac{L}{\langle \ell_{sl} \rangle} (\langle \tau_{1d} \rangle + \tau_{3d})$$

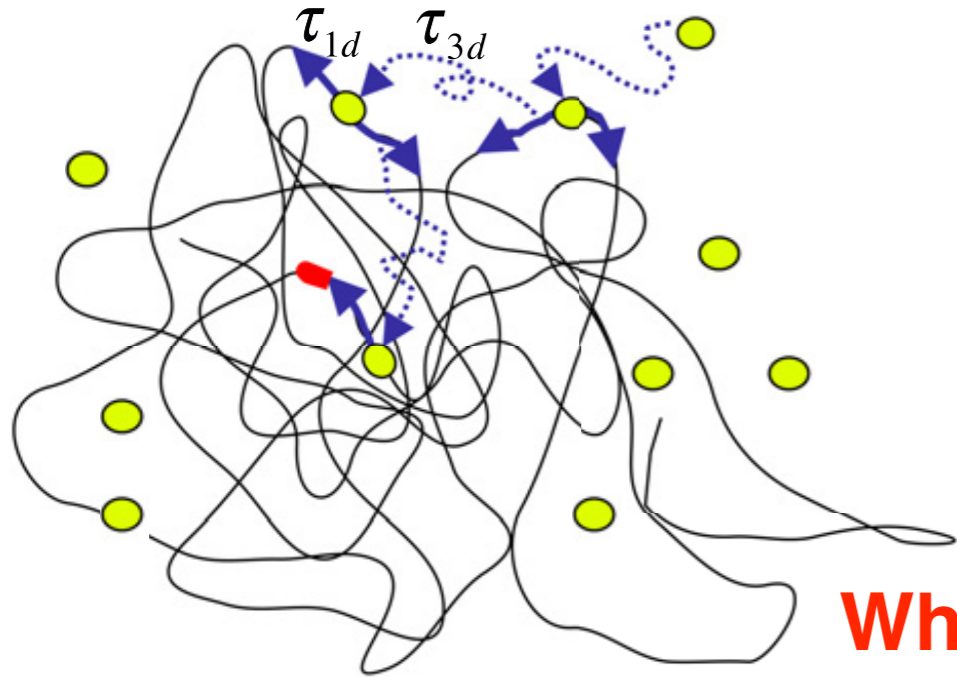
**average sliding length**

$$\langle \ell_{sl} \rangle = 2\sqrt{D_1 \langle \tau_{1d} \rangle}$$



# Simultaneous search for target site by multiple proteins

Interactions and collisions between proteins are ignored



Search times for target site by individual proteins are exponentially distributed

$$p_1(t_s) = \frac{1}{\langle t_s \rangle} e^{-t_s / \langle t_s \rangle}$$

What is the typical search time for the fastest of  $n$  independently searching proteins?

(Extreme value distributions)

$$p_n(t_s) = n \times p_1(t_s) \times \left( \int_{t_s}^{\infty} dt' p_1(t') \right)^{n-1} = \frac{n}{\langle t_s \rangle} e^{-nt_s / \langle t_s \rangle}$$

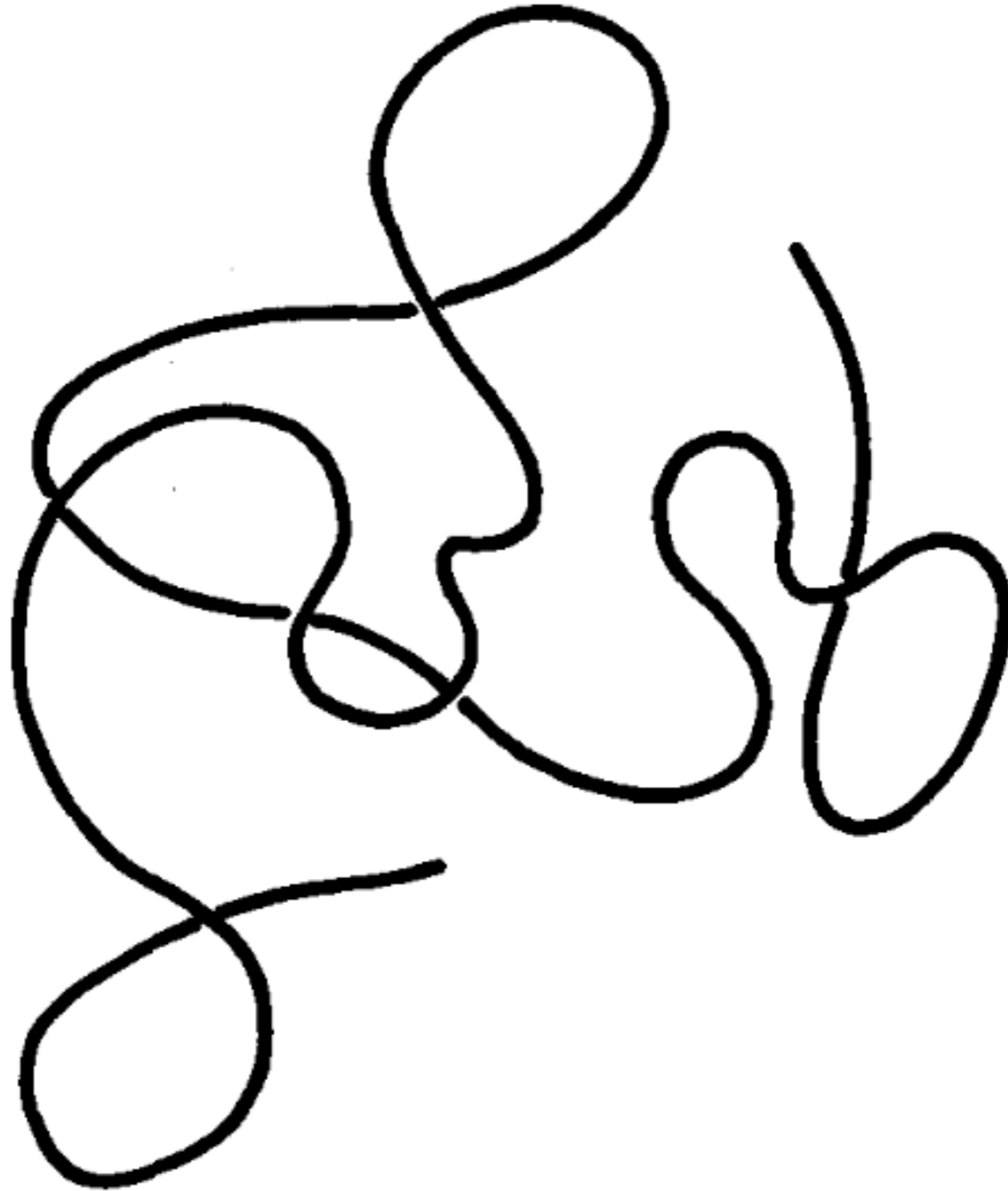
probability that one of  $n$  proteins finds the target site at time  $t_s$

probability that other  $n-1$  proteins take longer time to find the target site

Average search time is reduced by factor  $n$

$$\int_0^{\infty} dt_s t_s p_n(t_s) = \frac{\langle t_s \rangle}{n}$$

# Statistical mechanics of polymers and filaments



# Statistical mechanics of polymers and filaments

## molecular dynamics simulation



**Note: in equilibrium averaging over time is equivalent to averaging over all possible configurations weighted with Boltzmann weights!**

**partition function  
(sum over all possible configurations)**

$$Z = \sum_c e^{-E_c/k_B T}$$

$E_c$  energy of a given configuration

$T$  temperature

**expected value of observables**

$$\langle O \rangle = \sum_c O_c \frac{e^{-E_c/k_B T}}{Z}$$

$k_B$  Boltzmann constant

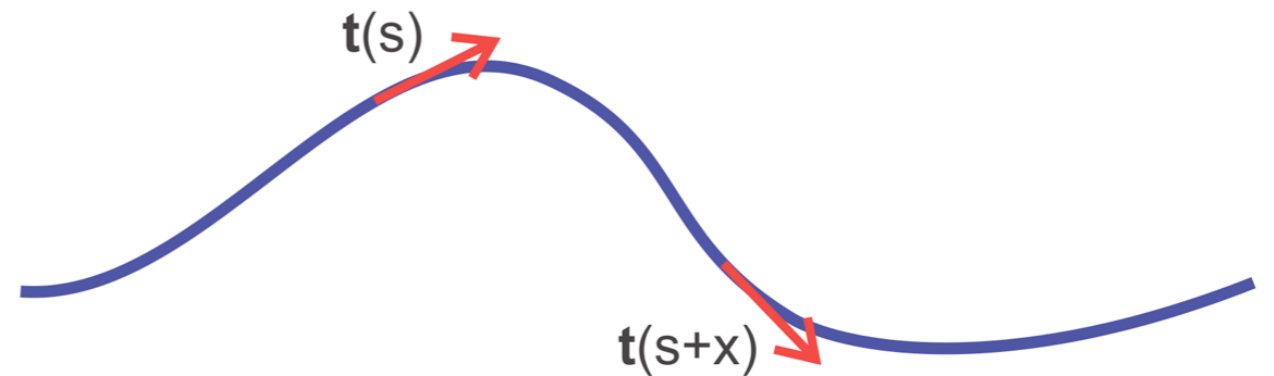
$$k_B = 1.38 \times 10^{-23} \text{ JK}^{-1}$$

# Persistence length

## correlations between tangents

$$\langle \mathbf{t}(s) \cdot \mathbf{t}(s+x) \rangle = e^{-x/\ell_p}$$

tangents become uncorrelated  
beyond persistence length!



**persistence  
length**

$$\ell_p = \frac{B}{k_B T}$$

**B** - filament bending rigidity  
**T** - temperature  
**L** - filament length

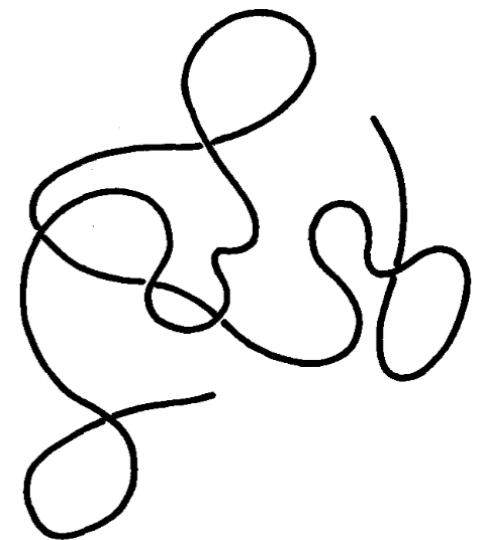
**Short filaments  
remain straight**

$$L \ll \ell_p$$



**Long filaments  
perform self-avoiding  
random walk**

$$L \gg \ell_p$$

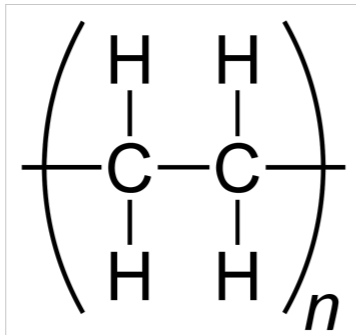




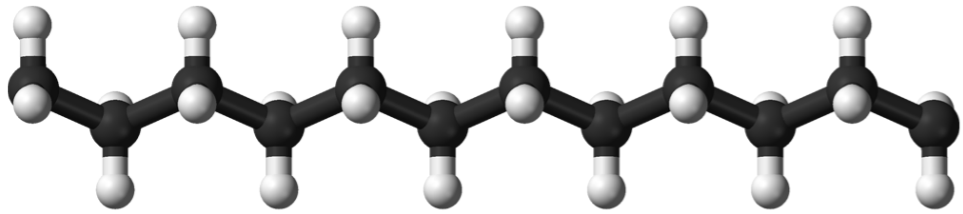
# Examples: persistence length

**polyethylene**

$$\ell_p = 2.6 \text{ nm}$$

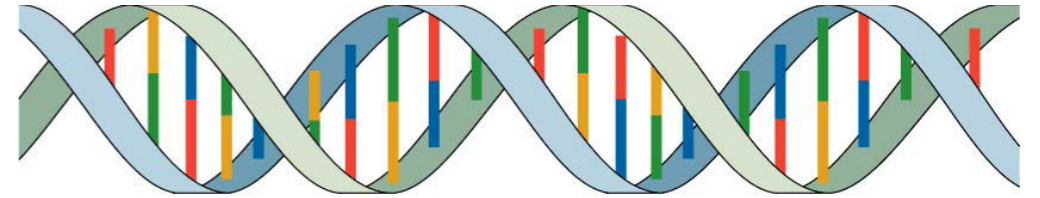


$$\ell_p = \frac{B}{k_B T}$$



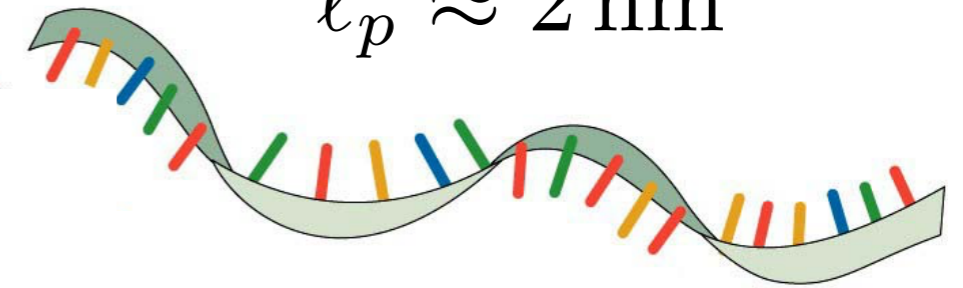
**double stranded DNA**

$$\ell_p \approx 50 \text{ nm}$$



**single stranded DNA**

$$\ell_p \approx 2 \text{ nm}$$



**uncooked spaghetti**

$$\ell_p \approx 10^{18} \text{ m}$$



**Persistence length for polymers is on the order of nm**

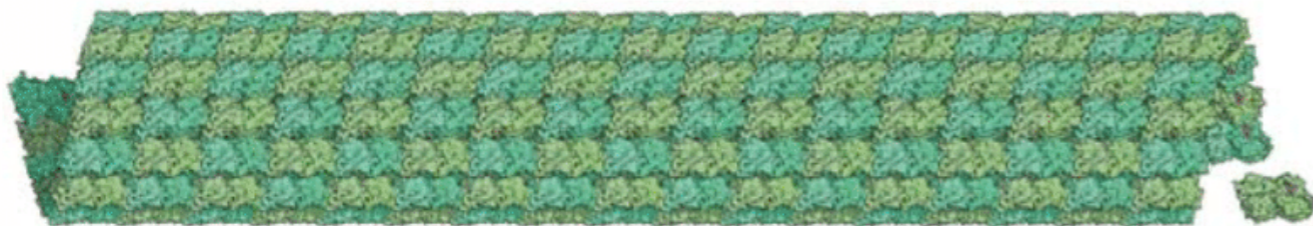
**actin**

$$\ell_p \approx 17 \mu\text{m}$$



**microtubule**

$$\ell_p \approx 1.4 \text{ mm}$$



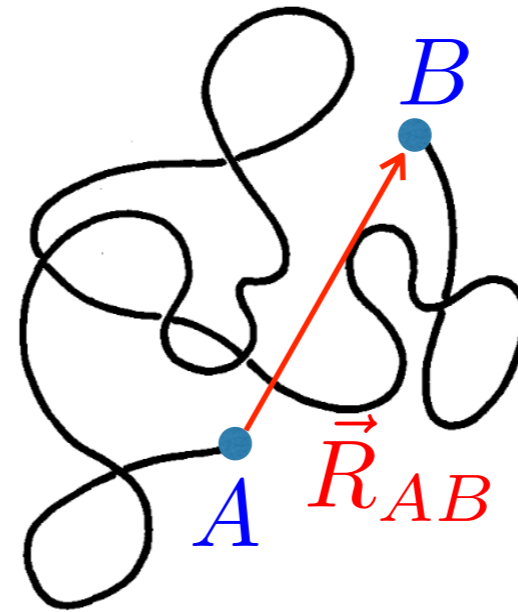
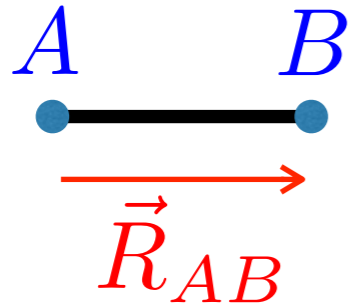
10 nm

# End-to-end distance

Short filaments  $L \ll \ell_p$

Long filaments

$L \gg \ell_p$



Over time thermal fluctuations reorient filaments in all possible directions!

$$\langle \vec{R}_{AB} \rangle = 0$$

$$\langle \vec{R}_{AB} \rangle = 0$$

$$\langle \vec{R}_{AB}^2 \rangle \approx L^2$$

$$\langle \vec{R}_{AB}^2 \rangle \approx 2\ell_p L = \frac{2BL}{k_B T}$$

**Exact result**

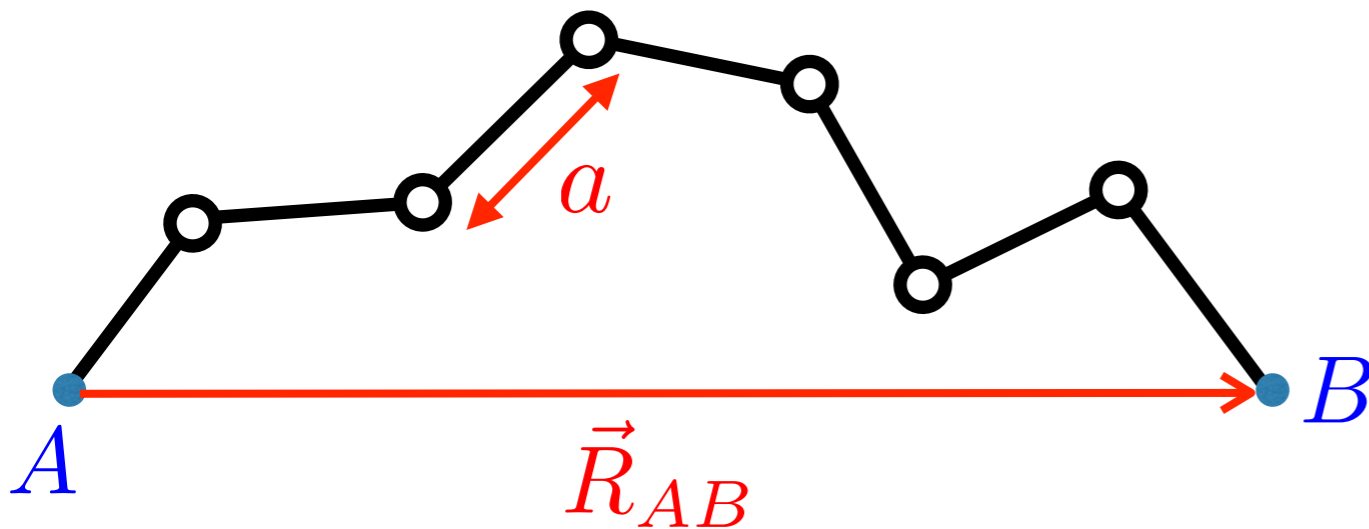
$$\langle \vec{R}_{AB}^2 \rangle = 2\ell_p L \left[ 1 - \frac{\ell_p}{L} \left( 1 - e^{-L/\ell_p} \right) \right]$$

Polymers shrink, when temperature is increased!  
Negative thermal expansion of rubber.

# Ideal chain vs worm-like chain

## Ideal chain

$N$  identical unstretchable links (Kuhn segments) of length  $a$  with freely rotating joints



Each configuration  $C$  has zero energy cost.

$$E_c = 0$$

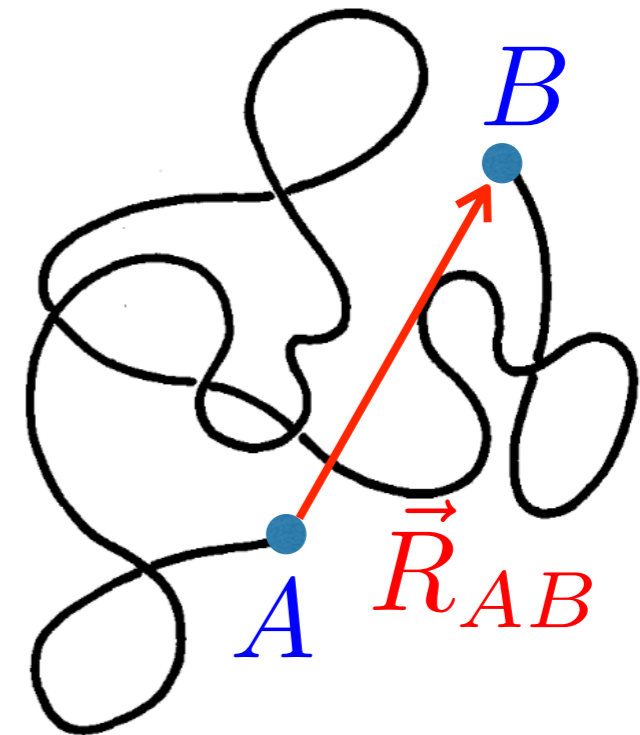
Each configuration  $C$  appears with probability

$$p_c \propto e^{-E_c/k_B T}$$

$L = Na$  - chain length

## Worm-like chain

Continuous unstretchable rod



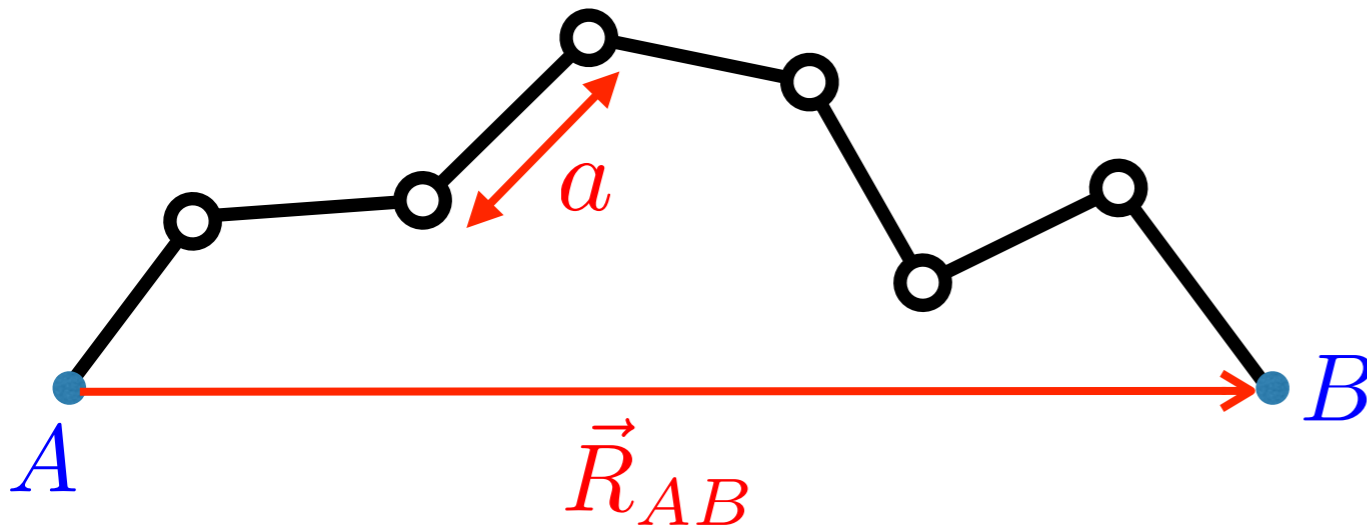
Bending energy cost of configuration  $C$ :

$$E_c = \frac{B}{2} \int_0^L ds \left( \frac{d^2 \vec{r}}{ds^2} \right)^2$$

# Ideal chain vs worm-like chain

## Ideal chain

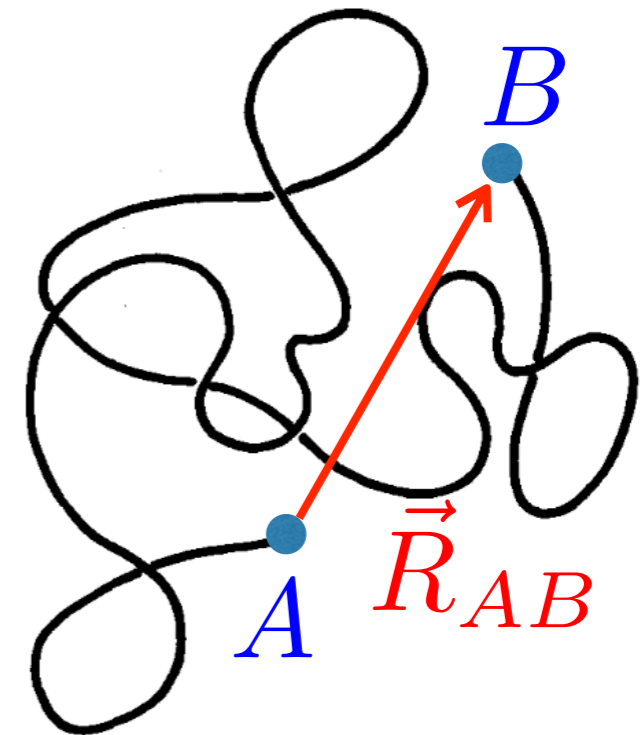
$N$  identical unstretchable links (Kuhn segments) of length  $a$  with freely rotating joints



$$\langle \vec{R}_{AB}^2 \rangle = Na^2 = aL$$

## Worm-like chain

Continuous unstretchable rod



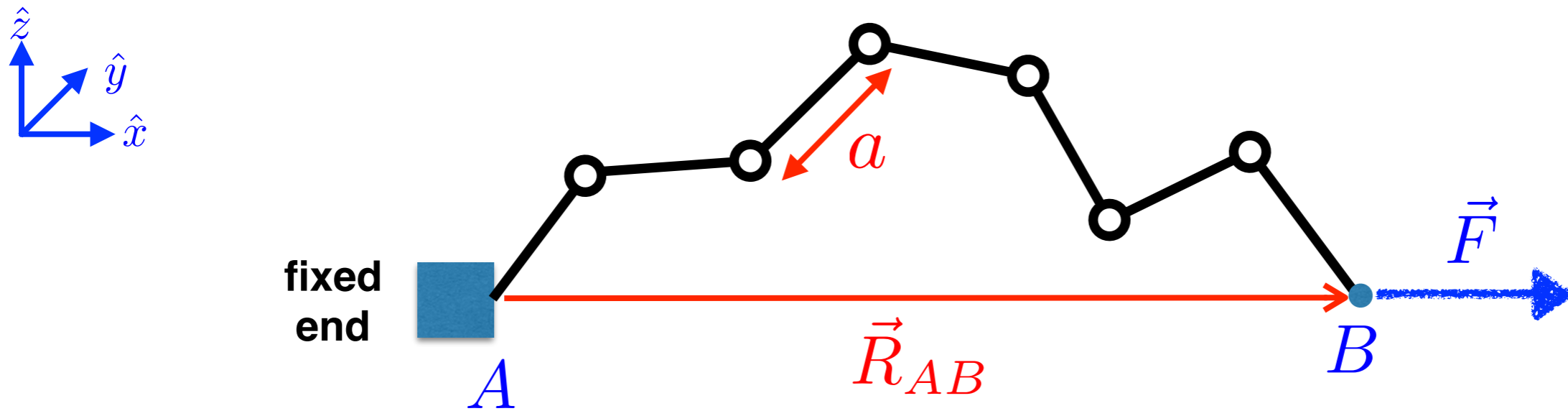
$$\langle \vec{R}_{AB}^2 \rangle \approx 2\ell_p L = \frac{2BL}{k_B T}$$

End-to-end distance fluctuations can be made identical if one chooses the segment length to be

$$a = 2\ell_p$$

$L = Na$  - chain length

# Stretching of ideal freely jointed chain



## Exact result for end-to-end distance

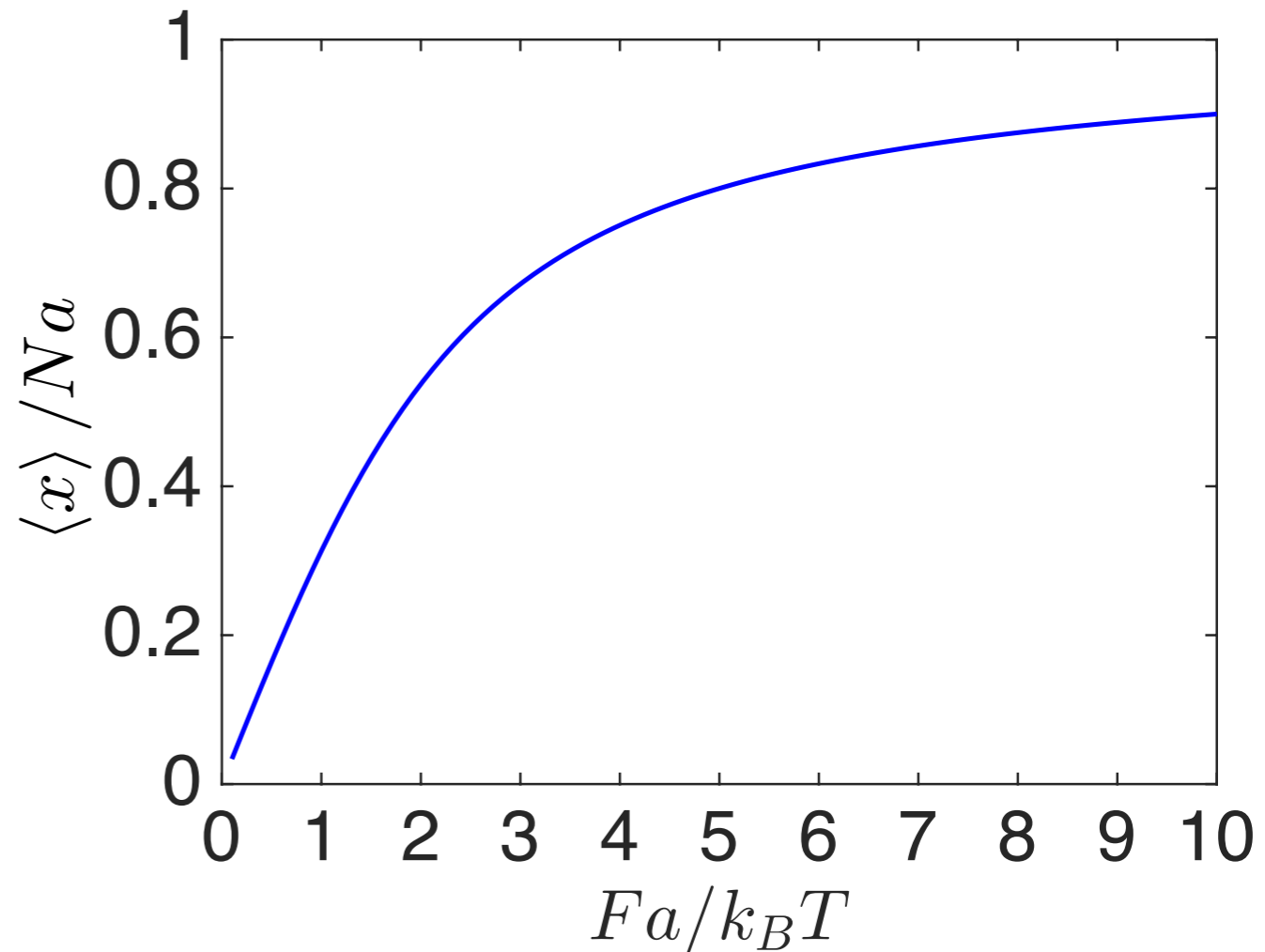
$$\langle x \rangle = Na \left( \coth \left[ \frac{Fa}{k_B T} \right] - \frac{k_B T}{Fa} \right)$$

**small force**  $Fa \ll k_B T$

$$\langle x \rangle \approx \frac{FNa^2}{3k_B T} = \frac{2FL\ell_p}{3k_B T}$$

**large force**  $Fa \gg k_B T$

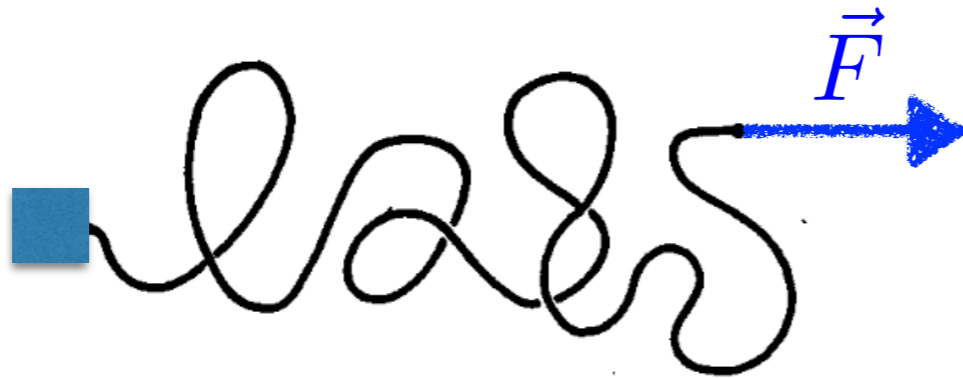
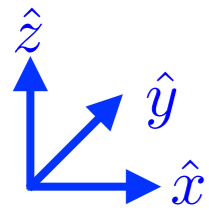
$$\langle x \rangle \approx Na \left( 1 - \frac{k_B T}{Fa} \right) = L \left( 1 - \frac{k_B T}{2F\ell_p} \right)$$



# Stretching of worm-like chains

Assume long chains  $L \gg \ell_p$

**small force**  $F\ell_p \ll k_B T$



$$\langle x \rangle \approx \frac{2FL\ell_p}{3k_B T} \equiv \frac{F}{k}$$

**entropic spring constant**

$$k = \frac{3k_B T}{2L\ell_p} = \frac{3k_B^2 T^2}{2LB}$$

**large force**  $F\ell_p \gg k_B T$



$$\langle x \rangle \approx L \left[ 1 - \sqrt{\frac{k_B T}{4F\ell_p}} \right]$$

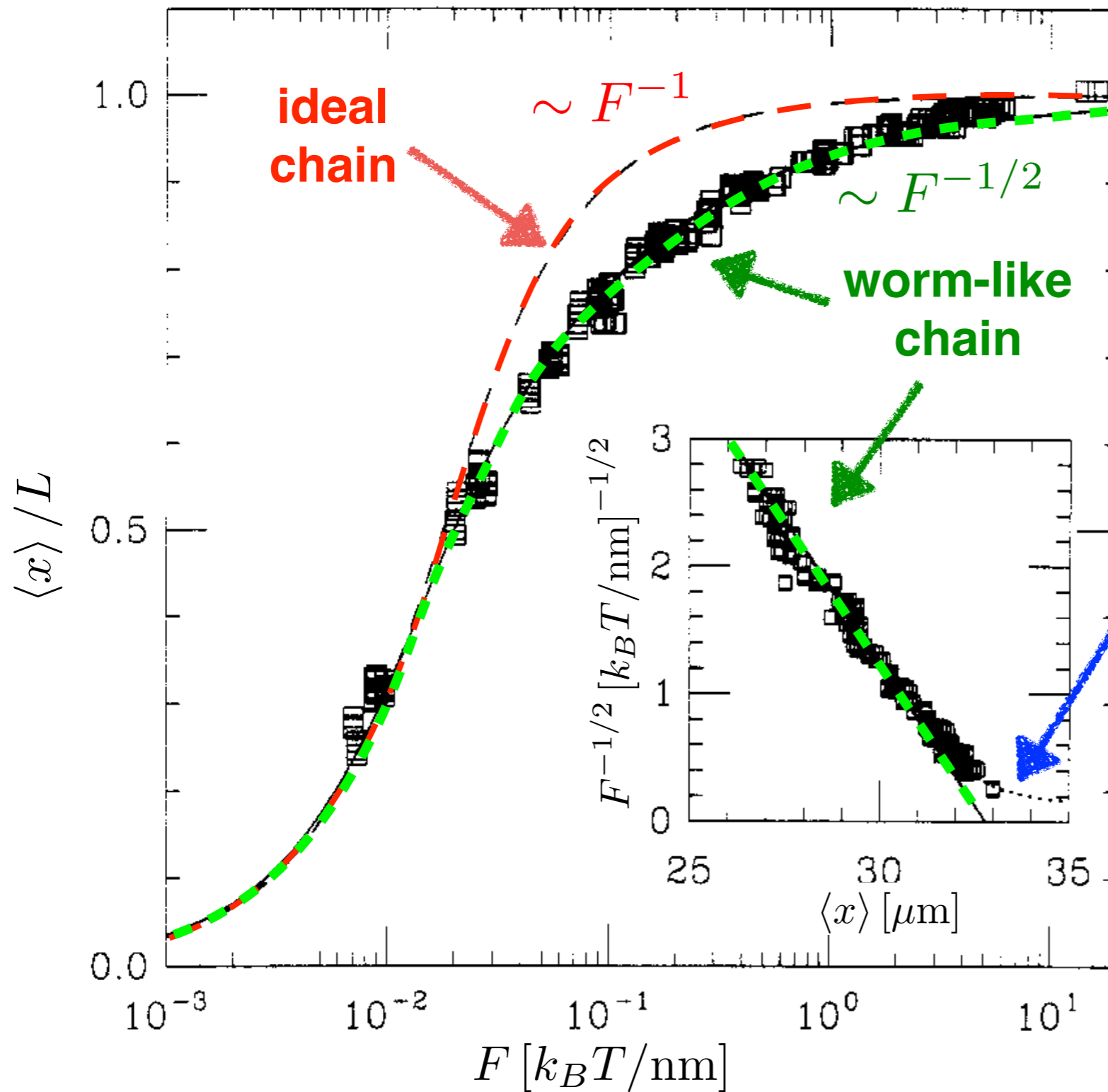
**B - filament bending rigidity**

**Approximate expression that interpolates between both regimes**

$$\frac{F\ell_p}{k_B T} = \frac{1}{4} \left( 1 - \frac{\langle x \rangle}{L} \right)^{-2} - \frac{1}{4} + \frac{\langle x \rangle}{L}$$

# Experimental results for stretching of DNA

$$L = 32.8 \mu\text{m}$$



$$1k_B T / \text{nm} \approx 4 \text{pN}$$

## Stretching of the DNA backbone

$$\langle x \rangle \approx L \left[ 1 - \sqrt{\frac{k_B T}{4F \ell_p}} \right] + \frac{FL}{\gamma}$$

### For DNA

$$\ell_p = 50 \text{nm}$$

$$\gamma \approx 500 k_B T / \text{nm} \approx 2 \text{nN}$$

### Improved interpolation formula

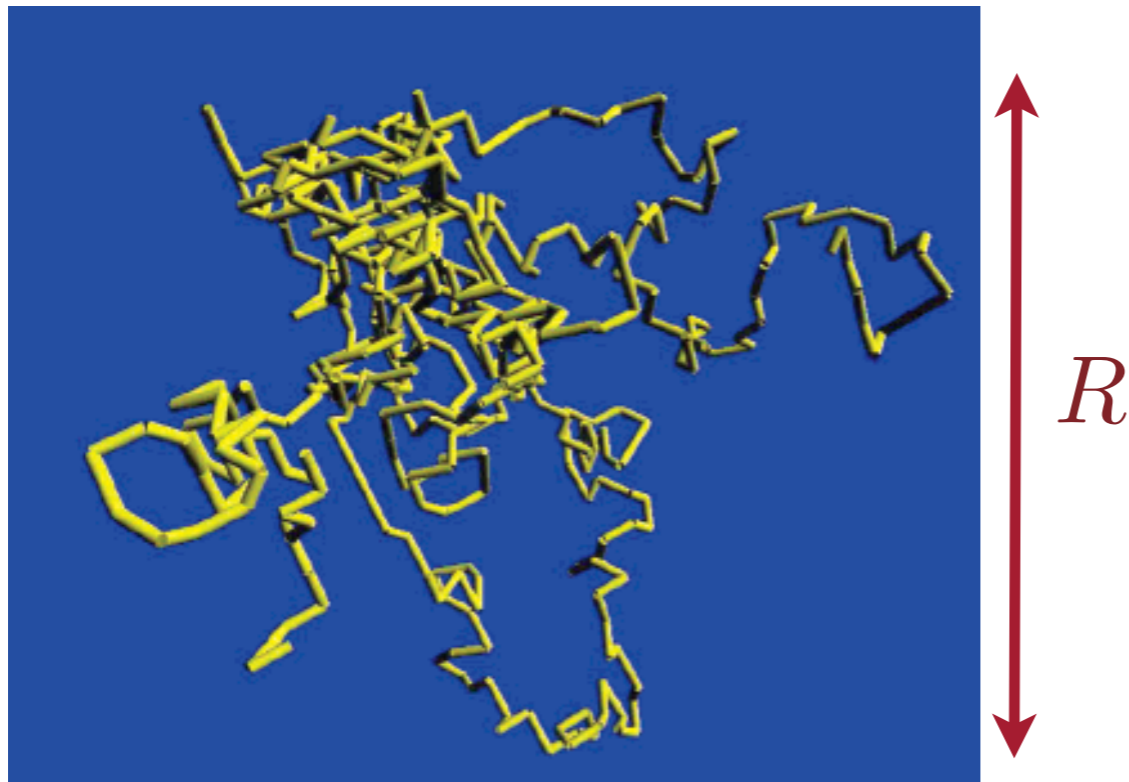
$$\frac{F \ell_p}{k_B T} = \frac{1}{4} \left( 1 - \frac{\langle x \rangle}{L} + \frac{F}{\gamma} \right)^{-2} - \frac{1}{4} + \frac{\langle x \rangle}{L} - \frac{F}{\gamma}$$

J.F. Marko and E.D. Siggia,  
Macromolecules **28**, 8759-8770 (1995)

# Random coil to globule transition in polymers

**random coil**

$$T > \Theta$$

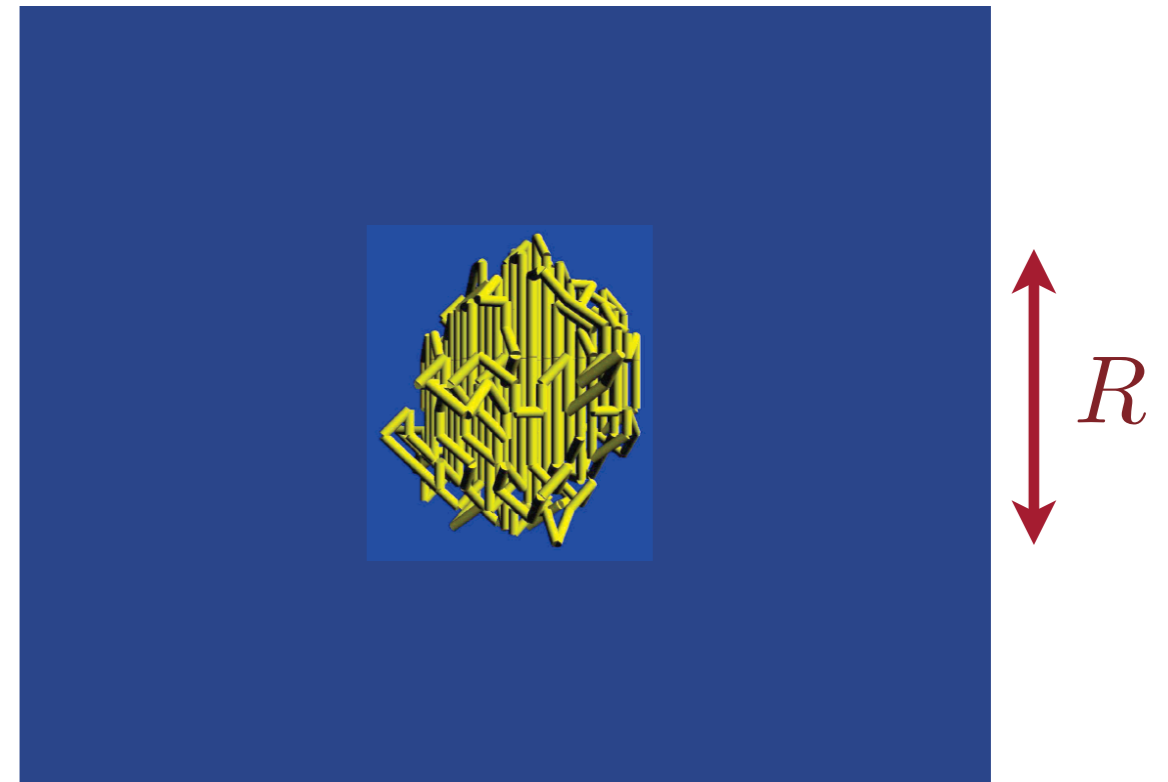


$$R \sim \sqrt{Ll_p}$$

**at high temperature  
entropic contributions  
dominate**

**compact globule**

$$T < \Theta$$



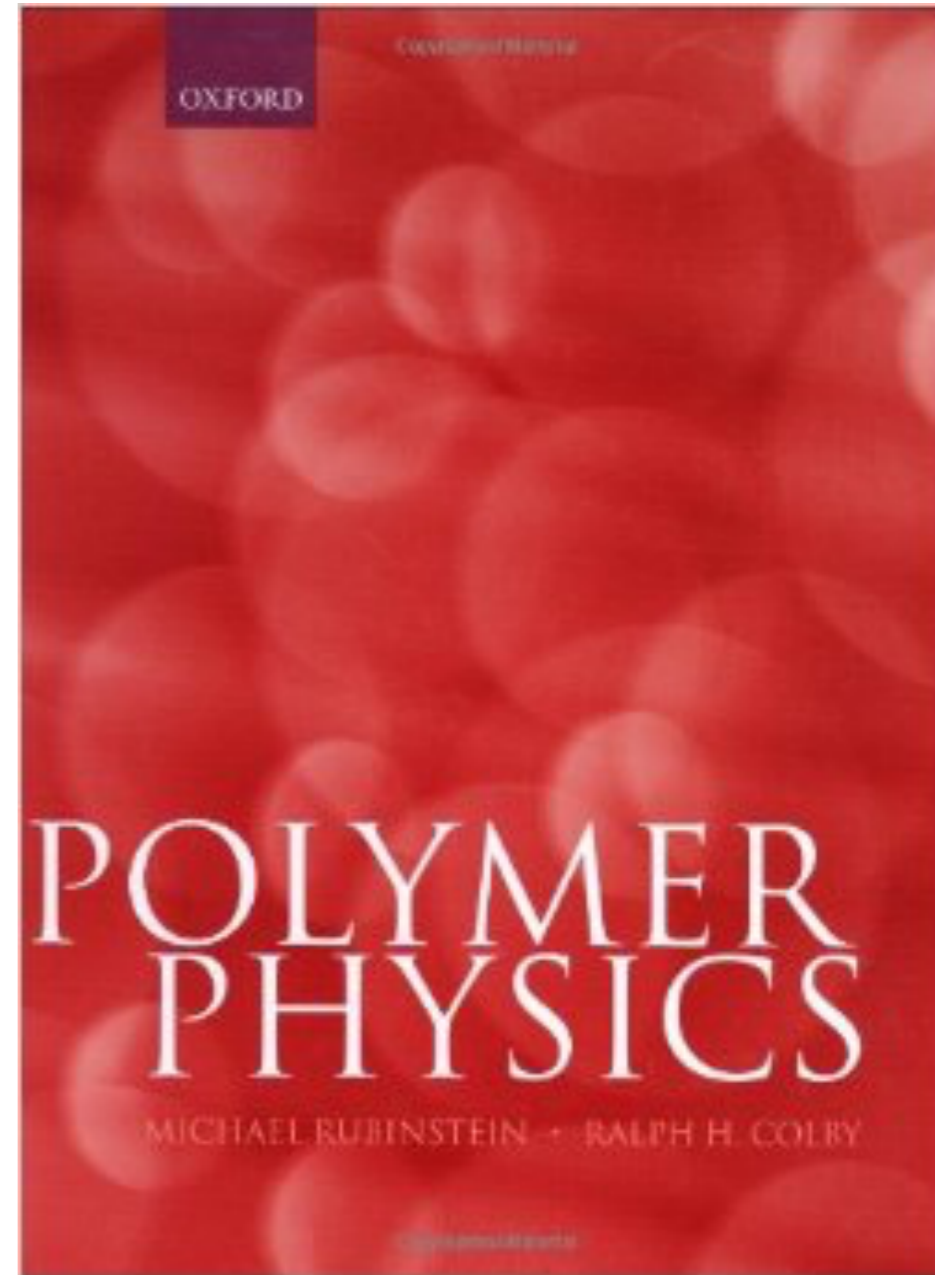
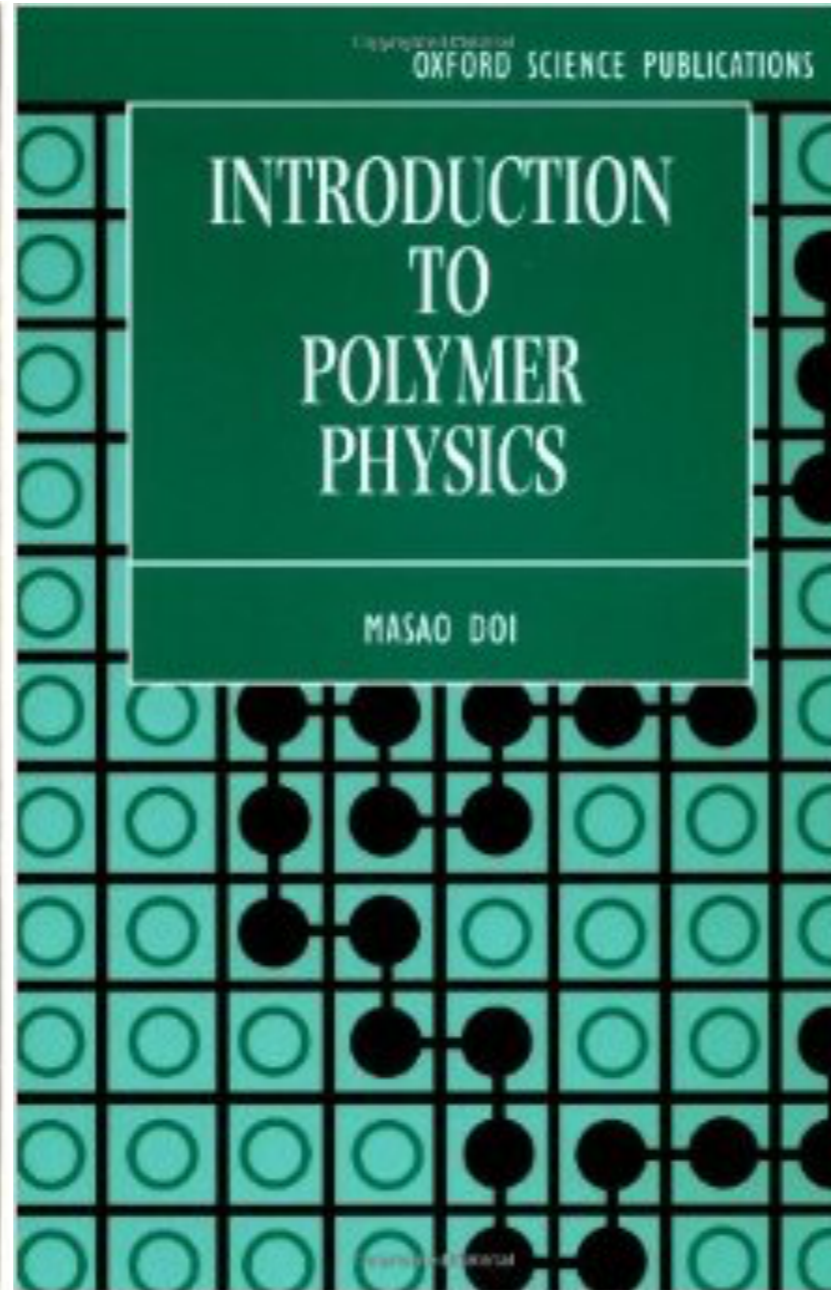
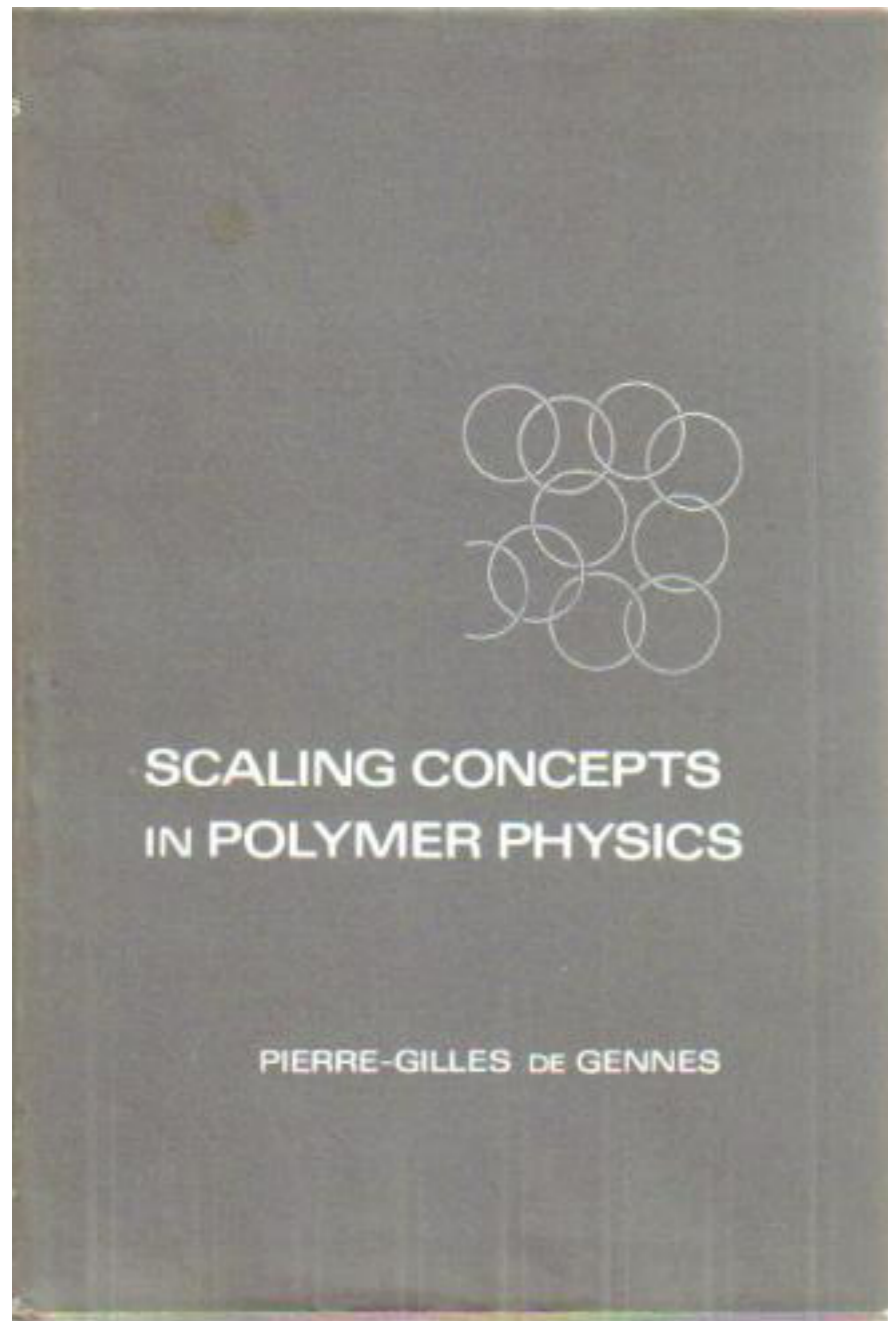
$$R \sim (d^2 L)^{1/3}$$

***d* - diameter of polymer chain  
at low temperature  
attraction between polymer  
chains dominates**

Figures from: W.B. Hu and D. Frenkel, J. Phys. Chem. B **110**, 3734 (2006)



# Further reading

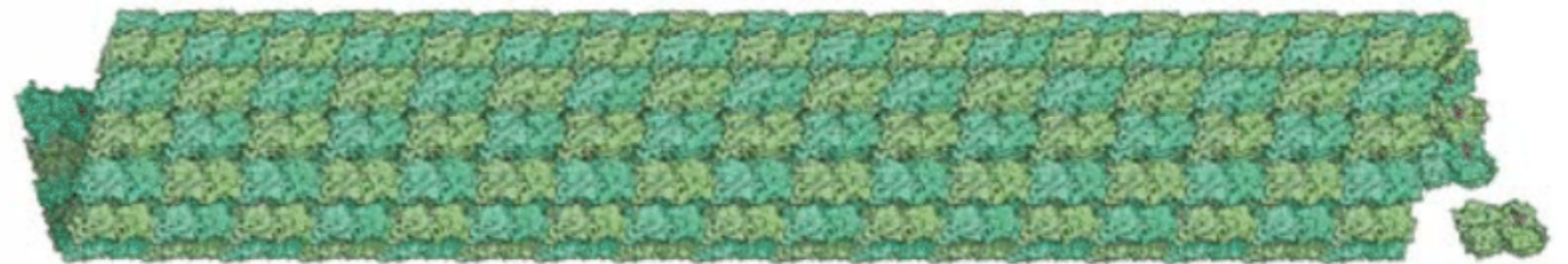


# Dynamics of actin filaments and microtubules

**Actin filament**



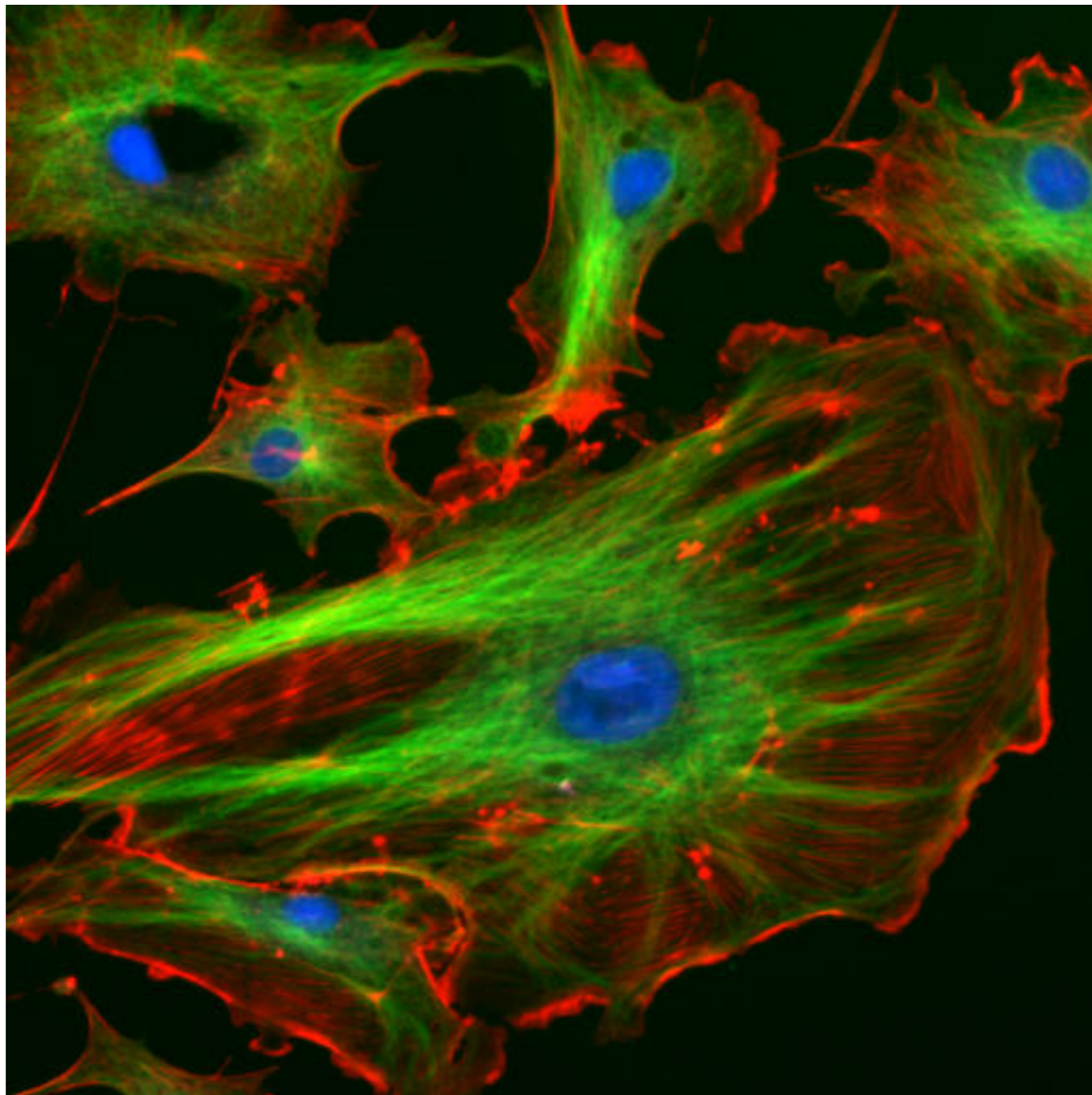
**Microtubule**



10 nm

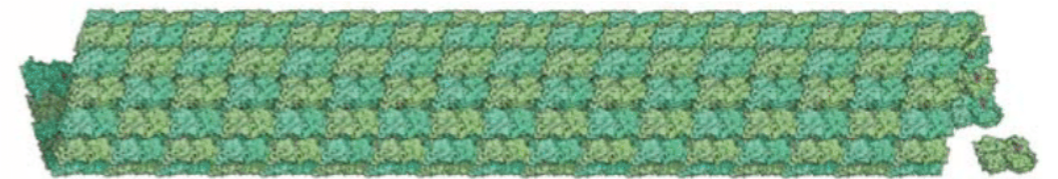
# Cytoskeleton in cells

Cytoskeleton matrix gives the cell shape and mechanical resistance to deformation.



(wikipedia)

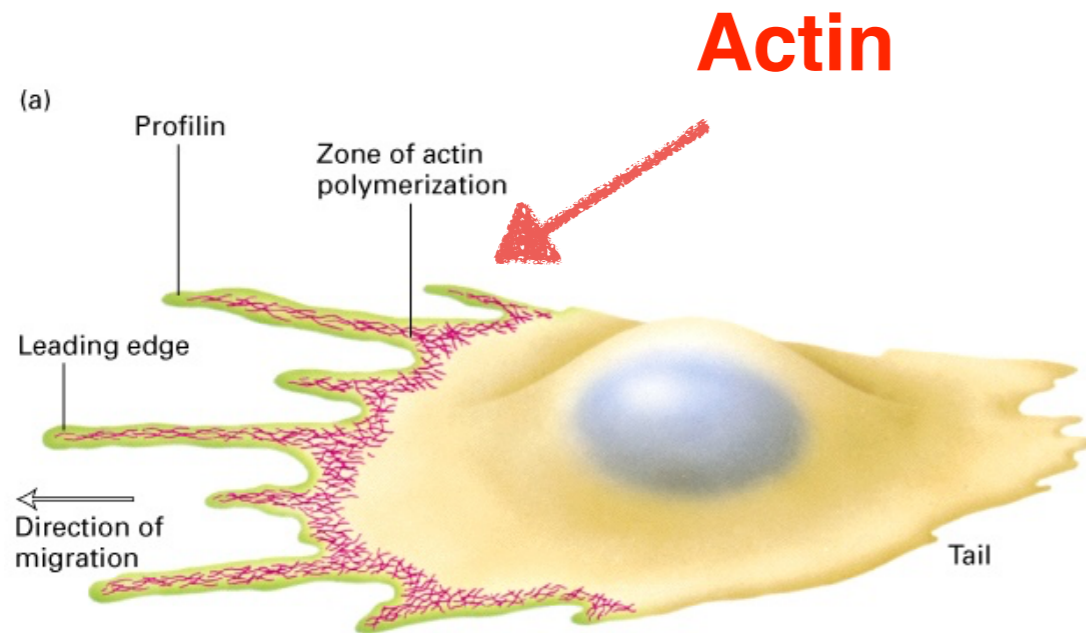
**Actin filament**



10 nm

**Microtubule**

# Crawling of cells



migration of skin cells during wound healing

spread of cancer cells during metastasis of tumors

amoeba searching for food

Immune system:  
neutrophils chasing bacteria

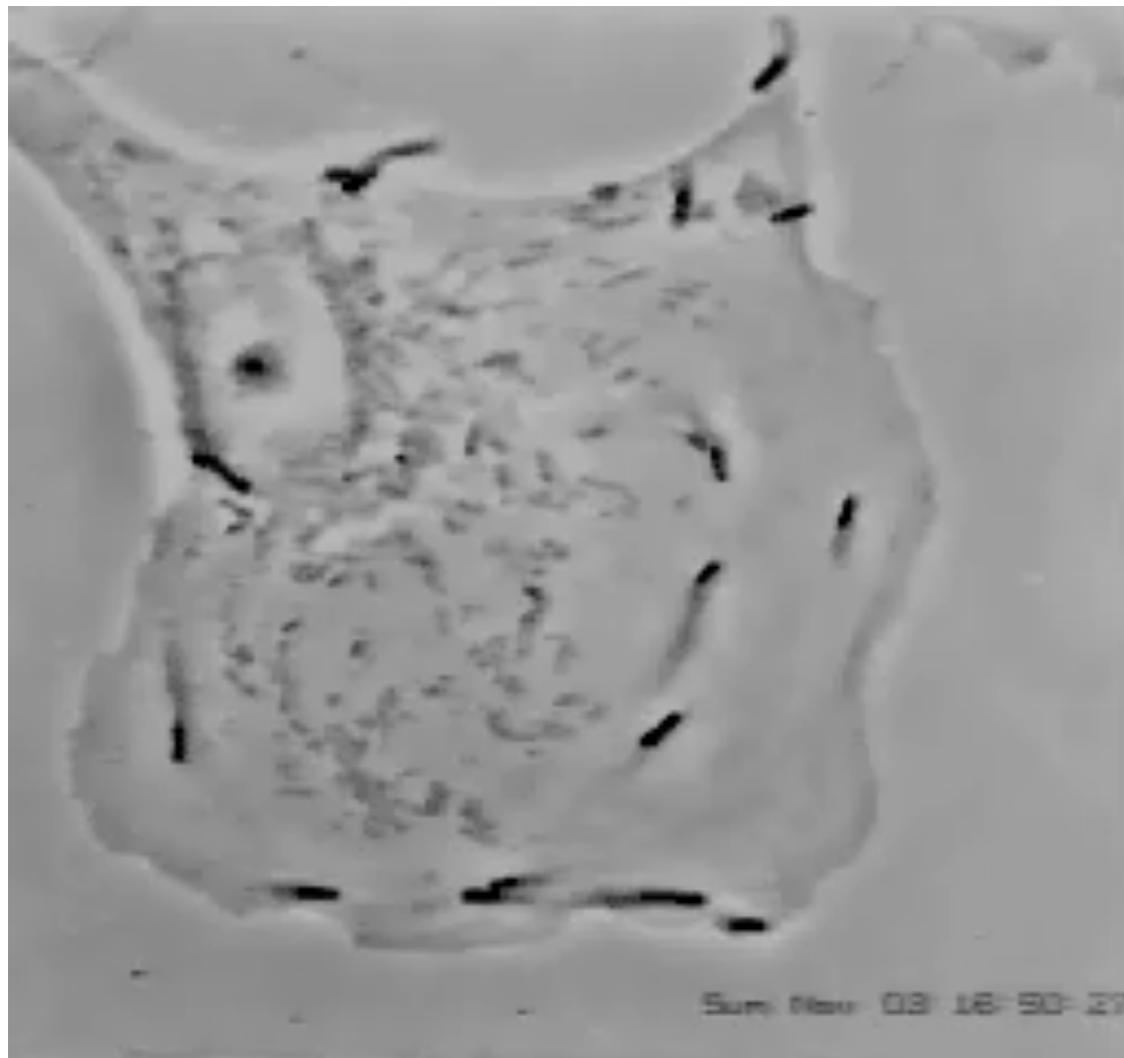


David Rogers, 1950s

$$v \sim 0.1 \mu\text{m/s}$$

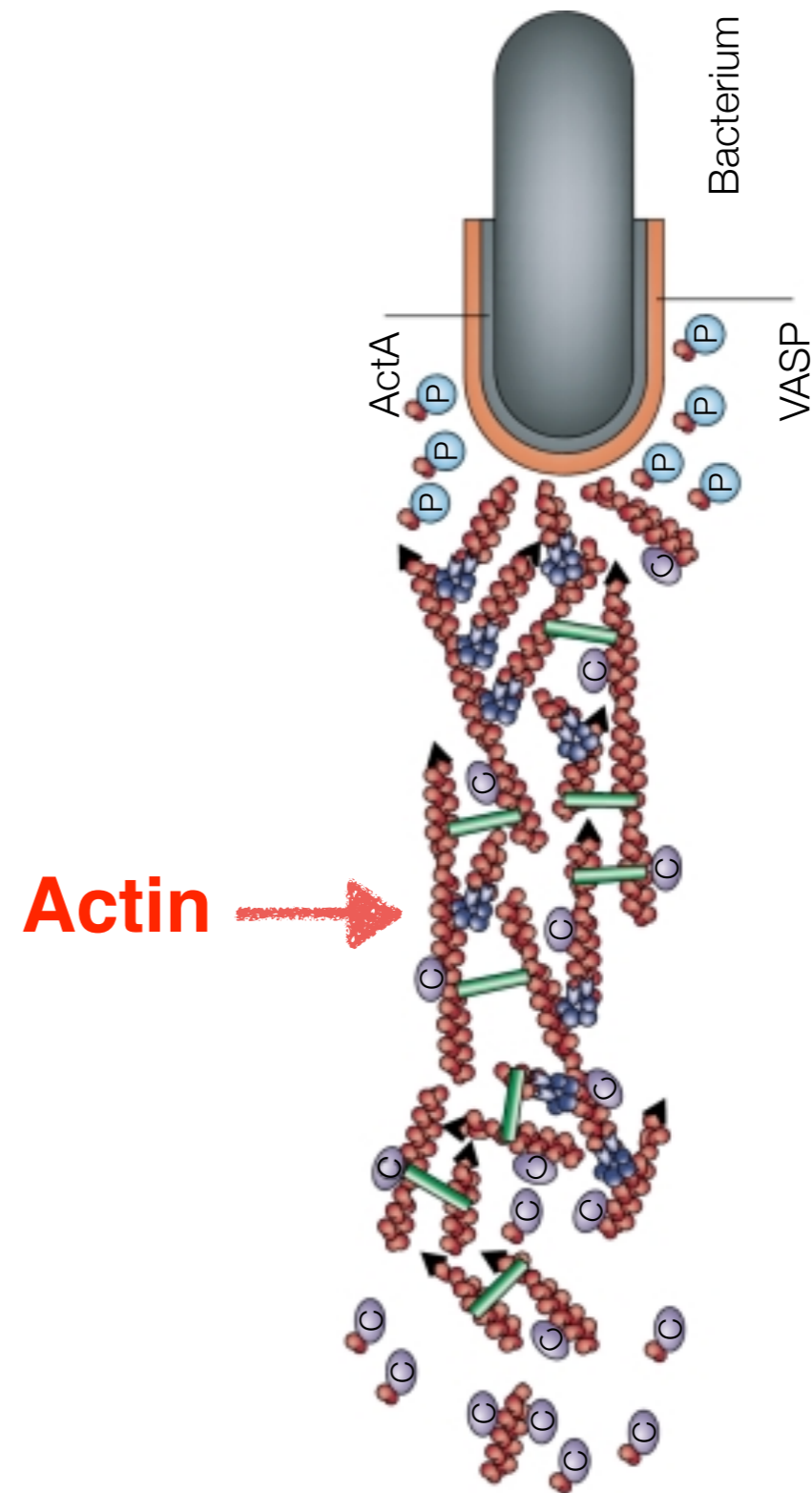
# Movement of bacteria

*Listeria monocytogenes*  
moving in infected cells



Julie Theriot (speeded up 150x)

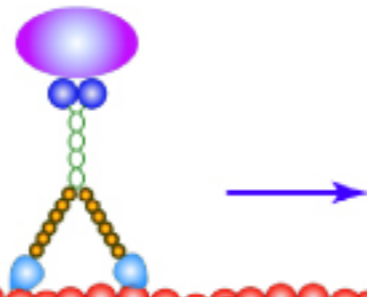
$$v \sim 0.1 - 0.3 \mu\text{m/s}$$



L. A. Cameron *et al.*,  
Nat. Rev. Mol. Cell Biol. **1**, 110 (2000)

# Molecular motors

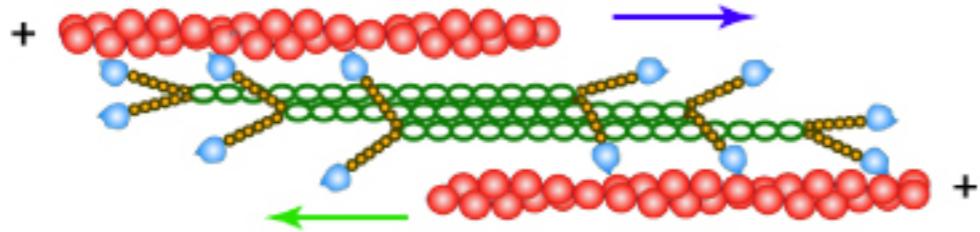
A Myosin V



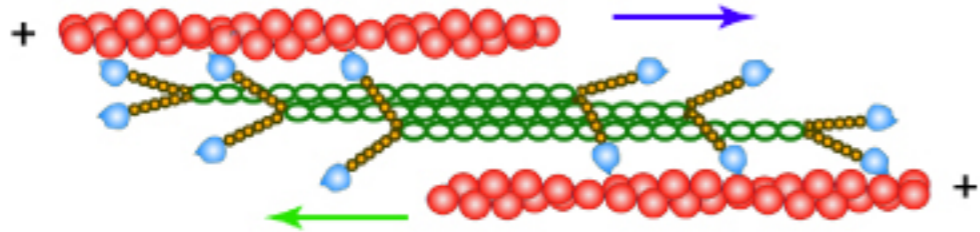
Actin



B Myosin II



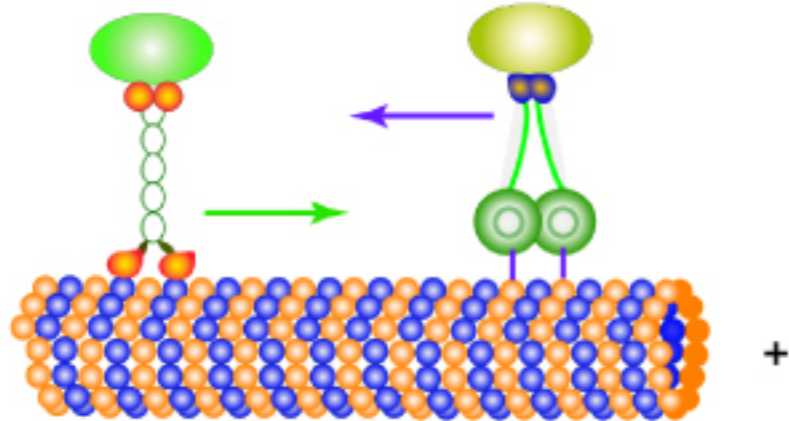
Actin



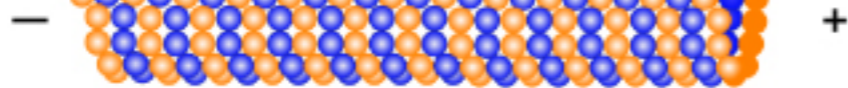
C

Kinesin-1

Dynein



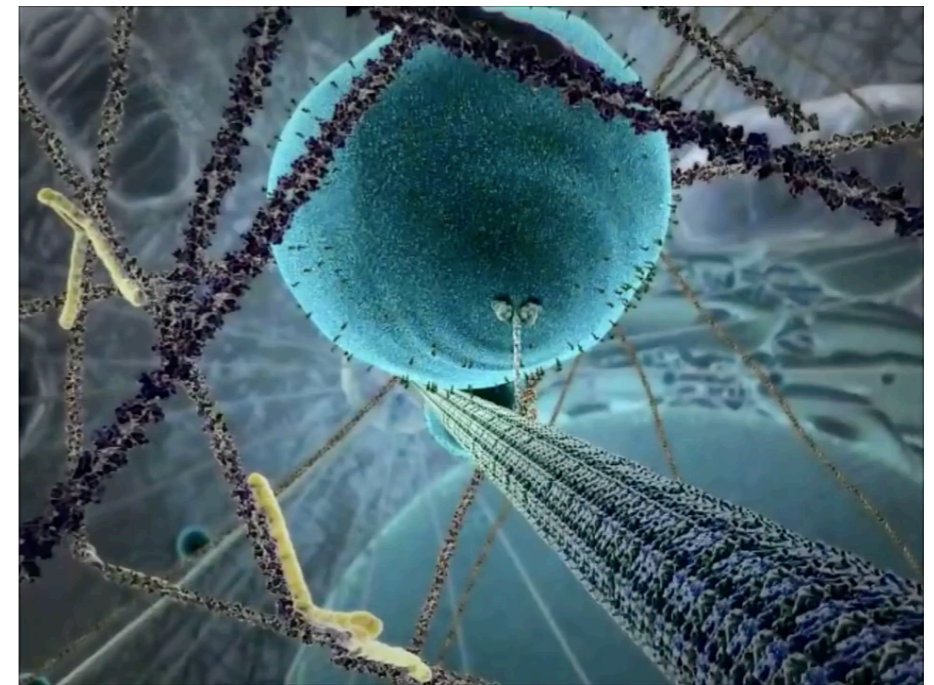
Microtubule



**Contraction of muscles**

**Transport of large molecules around cells  
(diffusion too slow)**

$$v \sim 1 \mu\text{m/s}$$



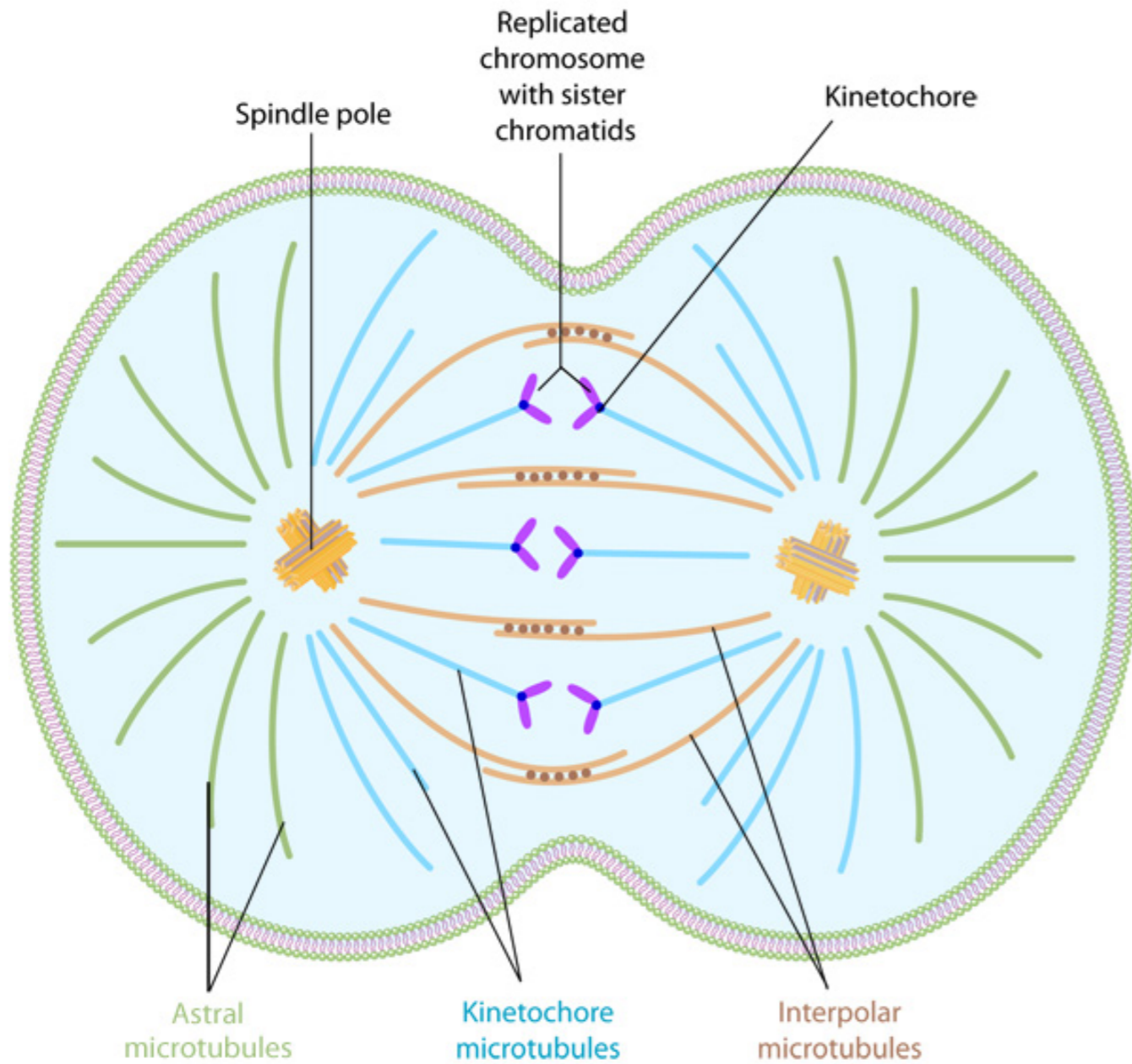
**Harvard BioVisions**

A.B. Kolomeisky, J. Phys.: Condens. Matter **25**, 463101 (2013)

<https://www.youtube.com/watch?v=FzcTgrxMzZk>

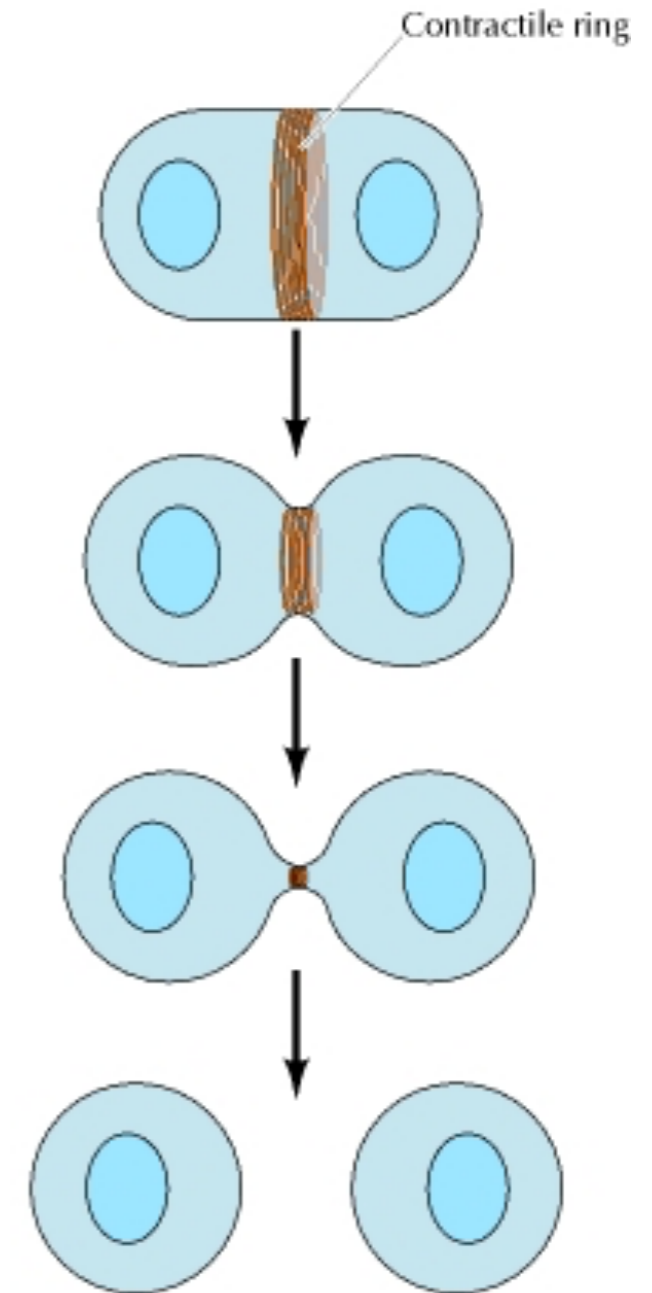
# Cell division

## Segregation of chromosomes



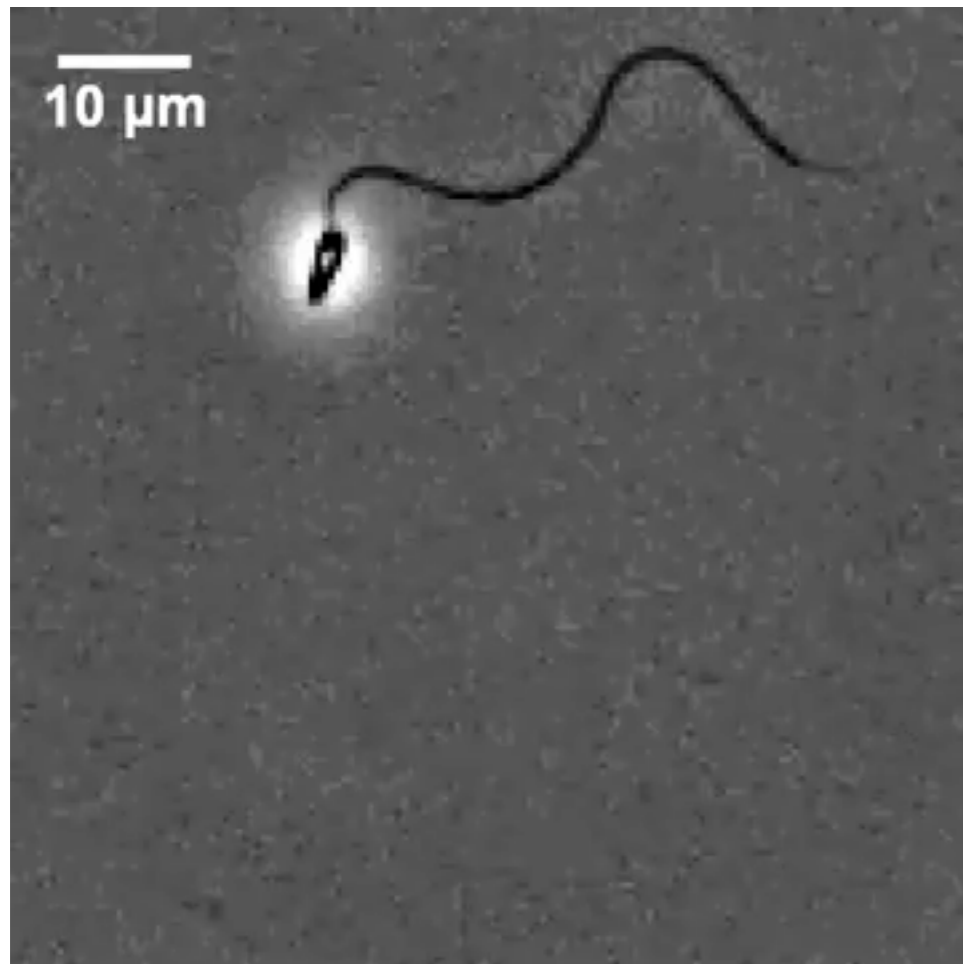
**Microtubules**

## Contractile ring divides the cell in two



**Actin**

## Swimming of sperm cells

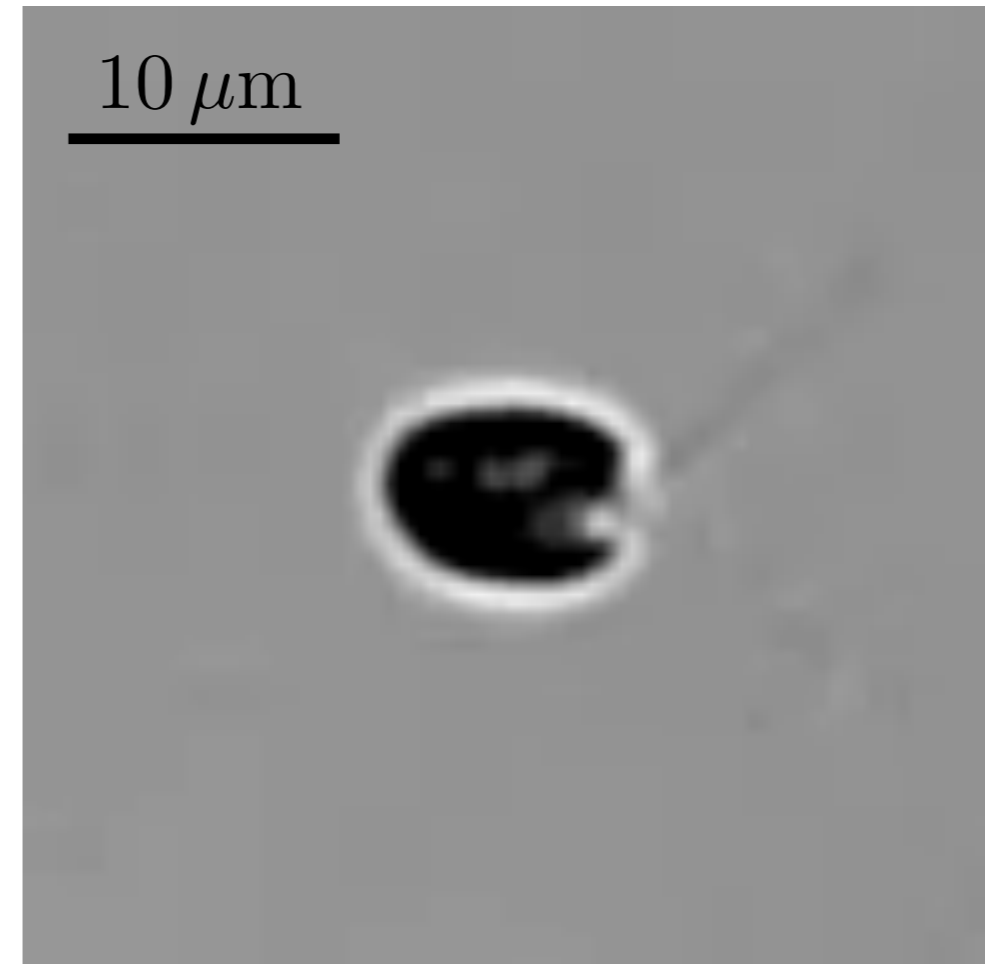


<https://sites.tufts.edu/guastolab/movies/>

**Jeff Guasto**

$v \sim 50 \mu\text{m/s}$

## Swimming of Chlamydomonas (green alga)



**Jeff Guasto**

$v \sim 60 \mu\text{m/s}$

**Bending is produced by motors walking on  
neighboring microtubule-like structures**



# Actin filaments

7nm



Minus end  
(pointed end)

Plus end  
(barbed end)

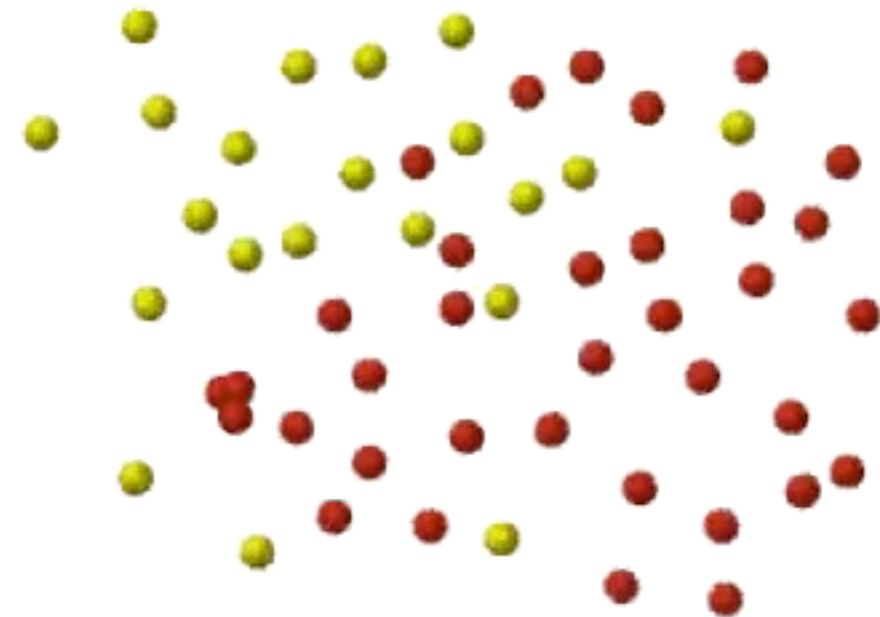
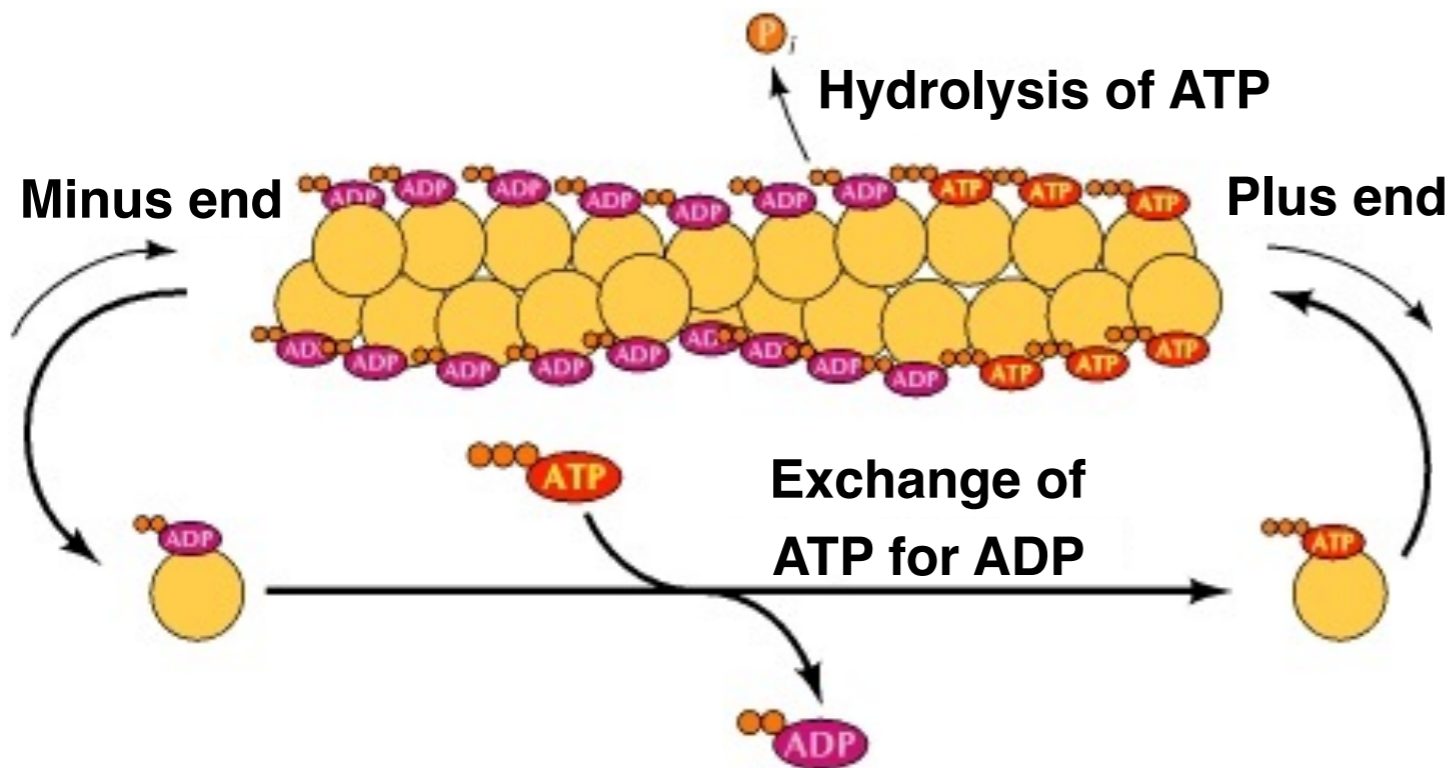
actin monomer



Persistence length  $\ell_p \sim 10\mu\text{m}$

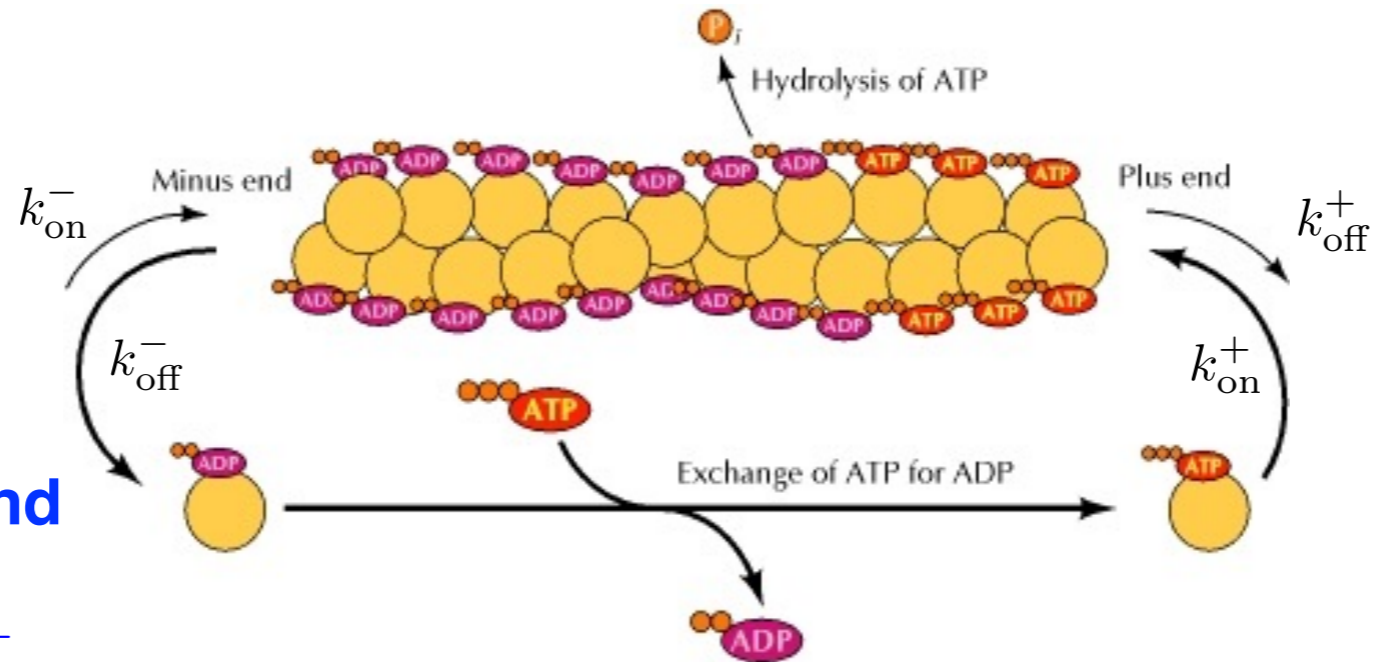
Typical length  $L \lesssim 10\mu\text{m}$

## Actin treadmilling



● ADP-actin  
● ATP-actin

# Actin growth



**growth of minus end**

$$\frac{dn^-}{dt} = k_{on}^- [M] - k_{off}^-$$

**no growth at**

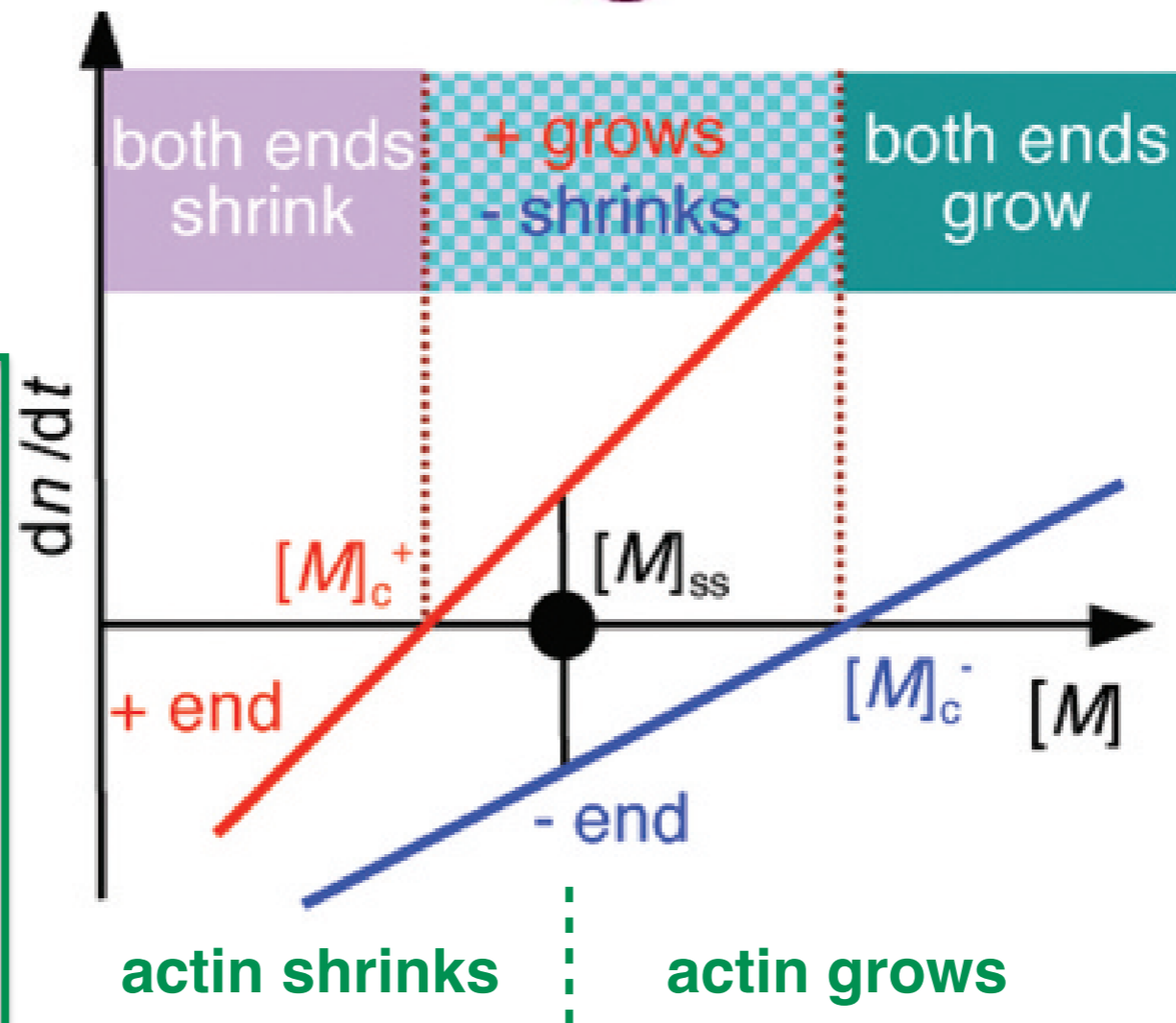
$$[M]_c^- = \frac{k_{off}^-}{k_{on}^-}$$

**growth of plus end**

$$\frac{dn^+}{dt} = k_{on}^+ [M] - k_{off}^+$$

**no growth at**

$$[M]_c^+ = \frac{k_{off}^+}{k_{on}^+}$$



**Steady state regime**

$$\frac{dn^+}{dt} = -\frac{dn^-}{dt}$$

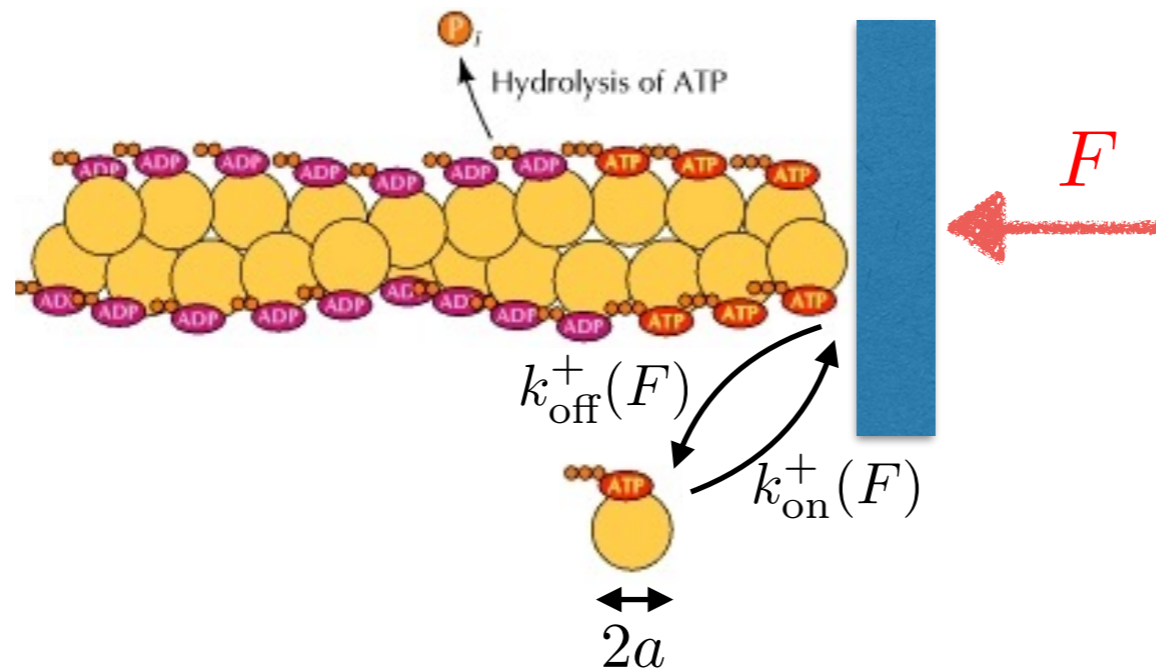
$$[M]_{ss} = \frac{k_{off}^+ + k_{off}^-}{k_{on}^+ + k_{on}^-} \approx 0.17 \mu\text{M}$$

**front speed**

$$\frac{dn^+}{dt} = \frac{k_{on}^+ k_{off}^- - k_{on}^- k_{off}^+}{k_{on}^+ + k_{on}^-} \approx 0.6 \text{s}^{-1}$$

**concentration of free actin monomers**

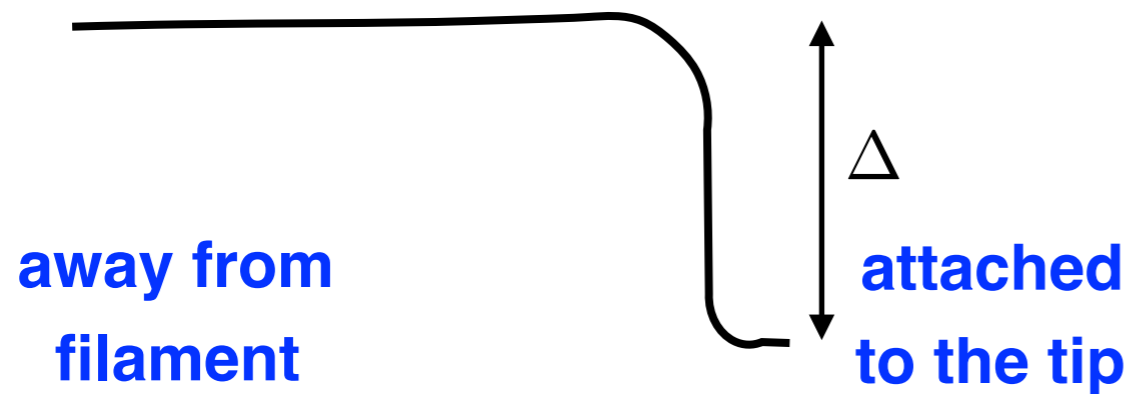
# Actin filament growing against the barrier



work done against the barrier for insertion of new monomer

$$W = Fa$$

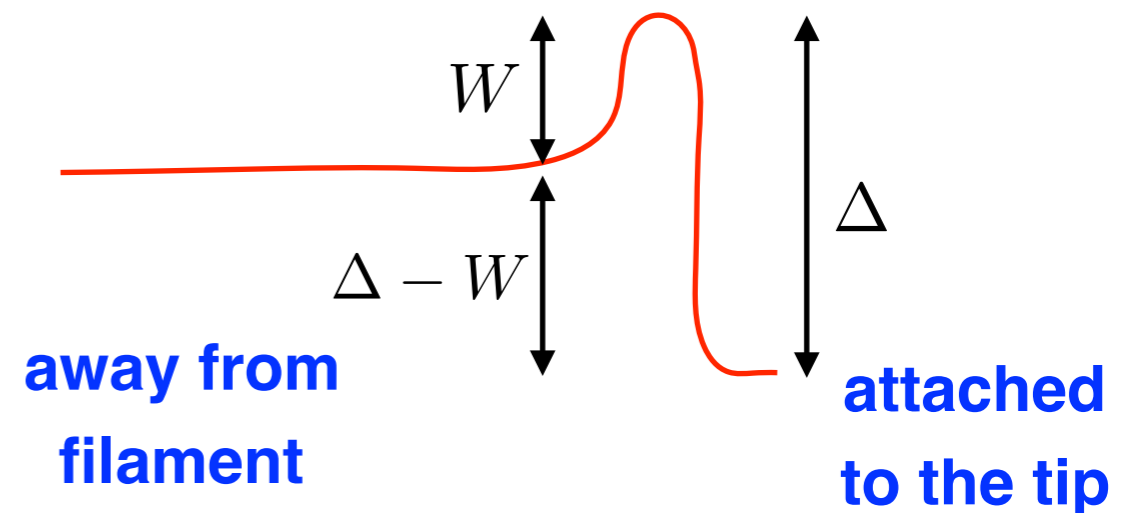
effective monomer free energy potential without barrier



$$k_{\text{on}}^+ \sim 4\pi D_3 a$$

$$k_{\text{off}}^+ \propto e^{-\Delta/k_B T}$$

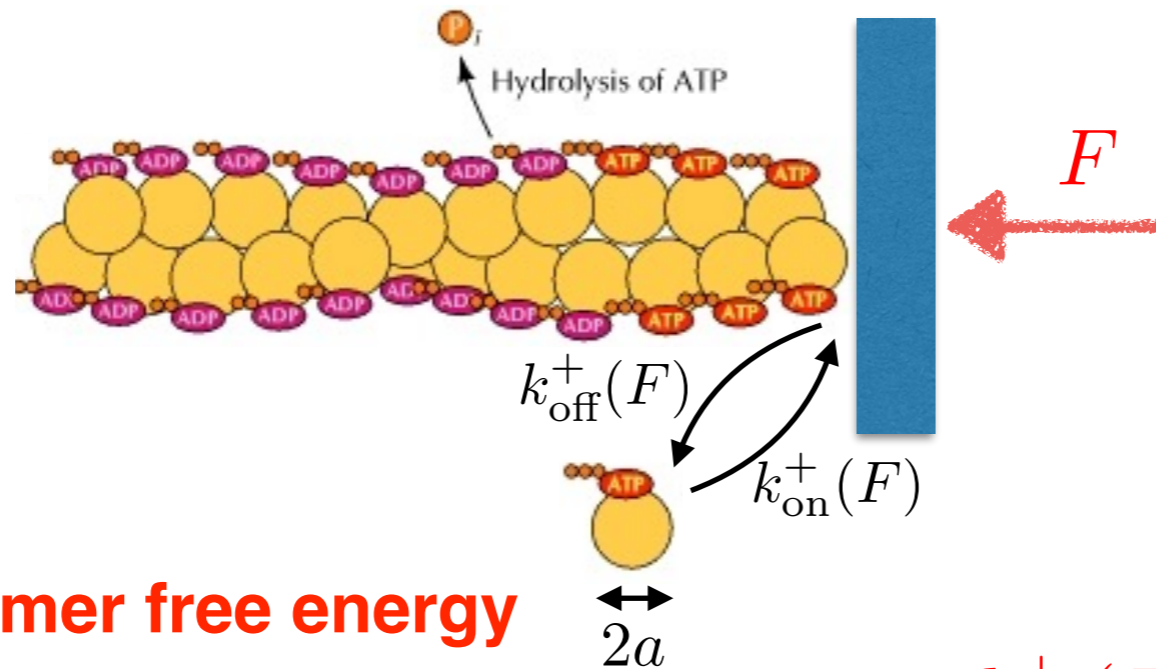
effective monomer free energy potential with barrier



$$k_{\text{on}}^+(F) \sim k_{\text{on}}^+ e^{-Fa/k_B T}$$

$$k_{\text{off}}^+(F) \sim k_{\text{off}}^+$$

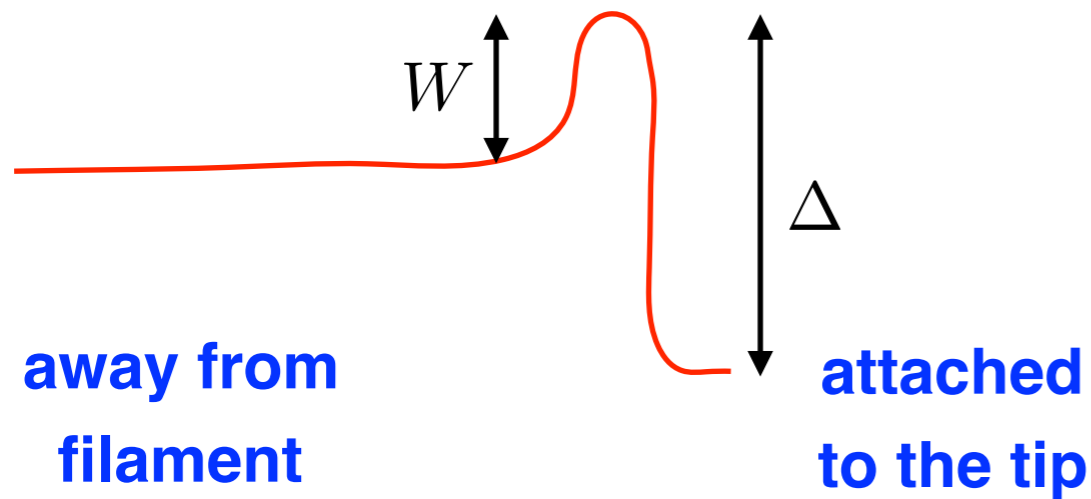
# Actin filament growing against the barrier



work done against the barrier for insertion of new monomer

$$W = Fa$$

effective monomer free energy potential with barrier



$$k_{\text{on}}^+(F) \sim k_{\text{on}}^+ e^{-Fa/k_B T}$$

$$k_{\text{off}}^+(F) \sim k_{\text{off}}^+$$

Growth speed of the tip

$$v^+(F) = \frac{dn^+(F)}{dt} = k_{\text{on}}^+[M]e^{-Fa/k_B T} - k_{\text{off}}^+$$

Maximal force that can be balanced by growing filament (stall force)

$$v^+(F_{\text{max}}) = 0 \longrightarrow F_{\text{max}} = \frac{k_B T}{a} \ln \left( \frac{k_{\text{on}}^+[M]}{k_{\text{off}}^+} \right)$$

$$k_{\text{on}}^+ \sim 10 \mu\text{M}^{-1} \text{s}^{-1}$$

$$k_{\text{off}}^+ \sim 1 \text{s}^{-1}$$

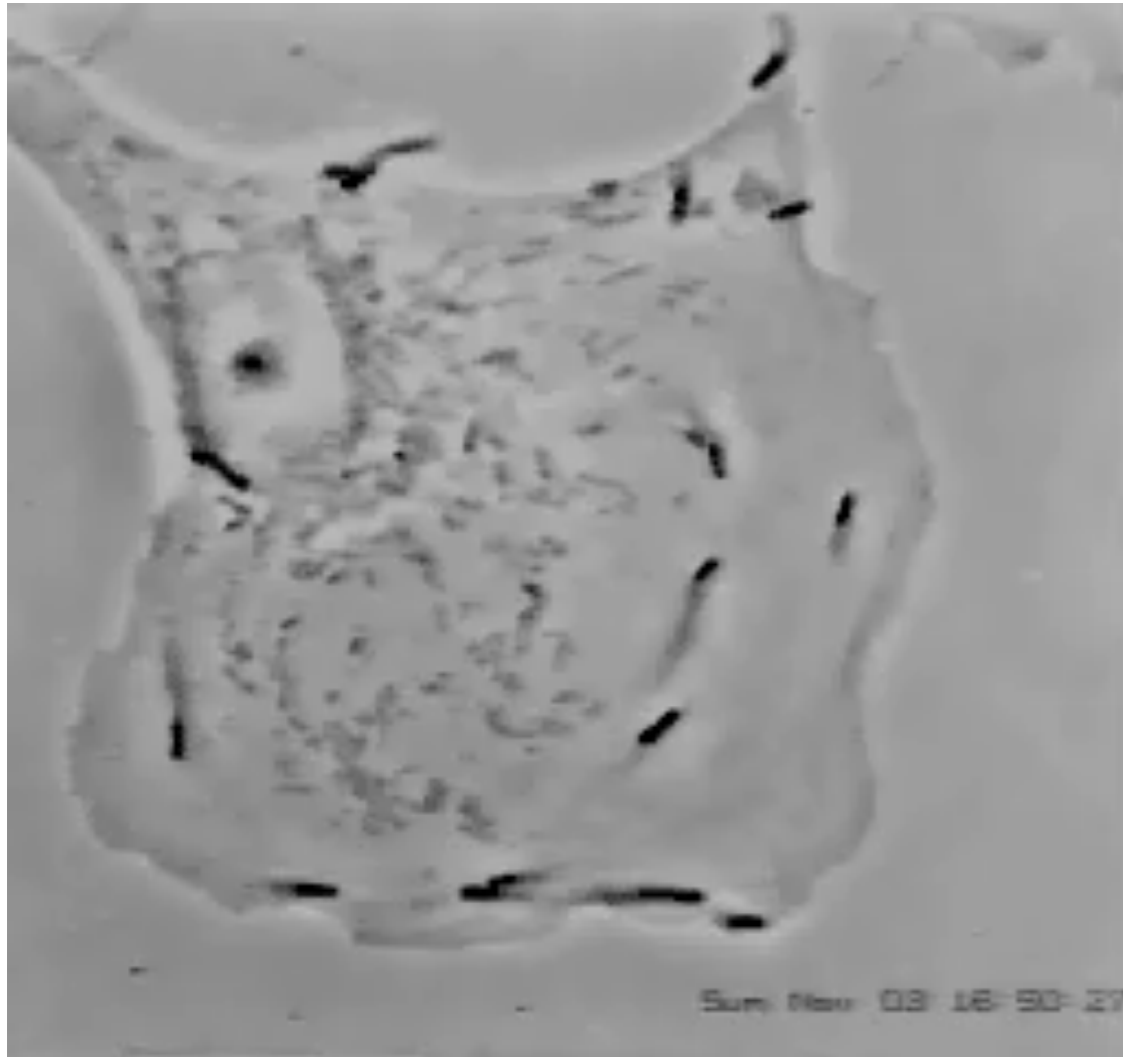
$$[M] \sim 10 \mu\text{M}$$

$$a \approx 2.5 \text{nm}$$

$$F_{\text{max}} \sim 8 \text{pN}$$

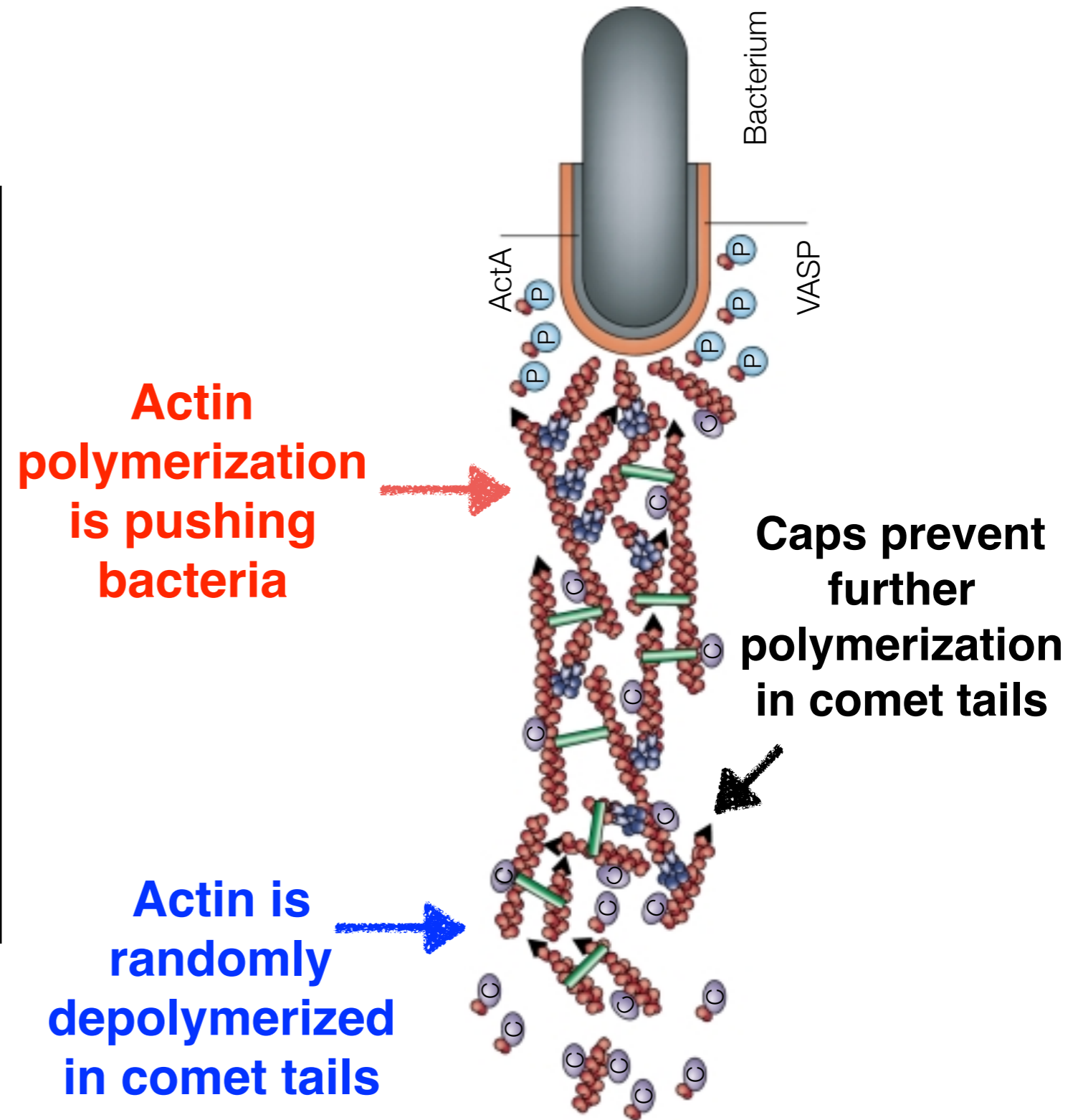
# Movement of bacteria

*Listeria monocytogenes*  
moving in infected cells



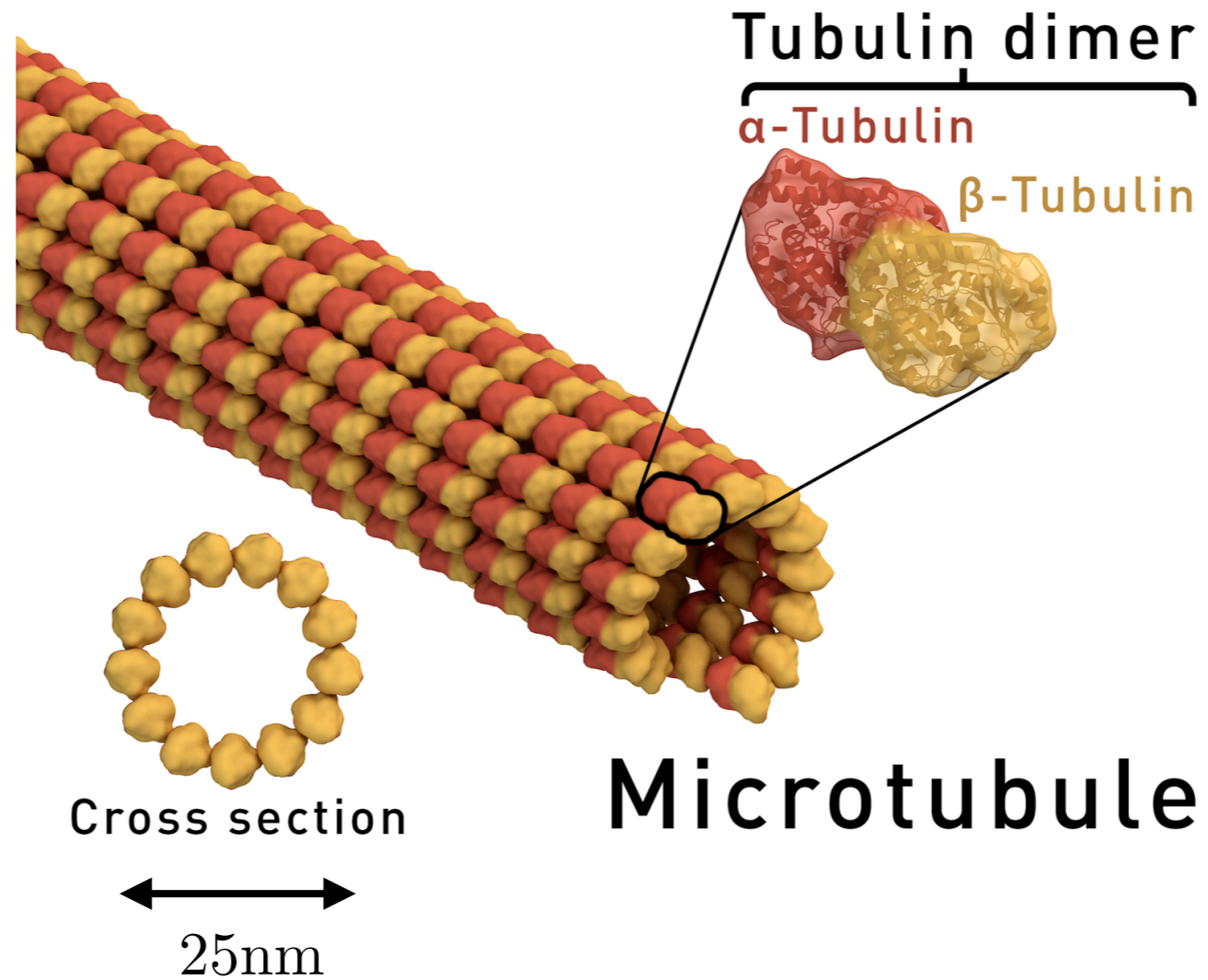
Julie Theriot (speeded up 150x)

$$v \sim 0.1 - 0.3 \mu\text{m/s}$$



L. A. Cameron *et al.*,  
Nat. Rev. Mol. Cell Biol. **1**, 110 (2000)

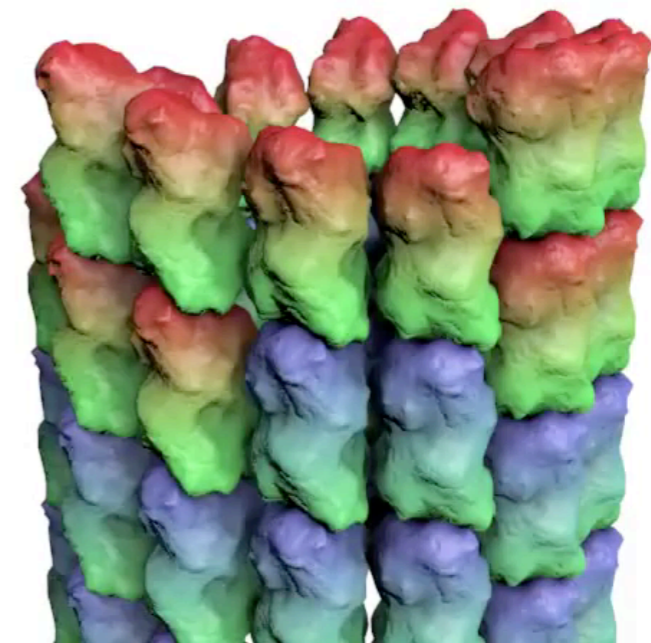
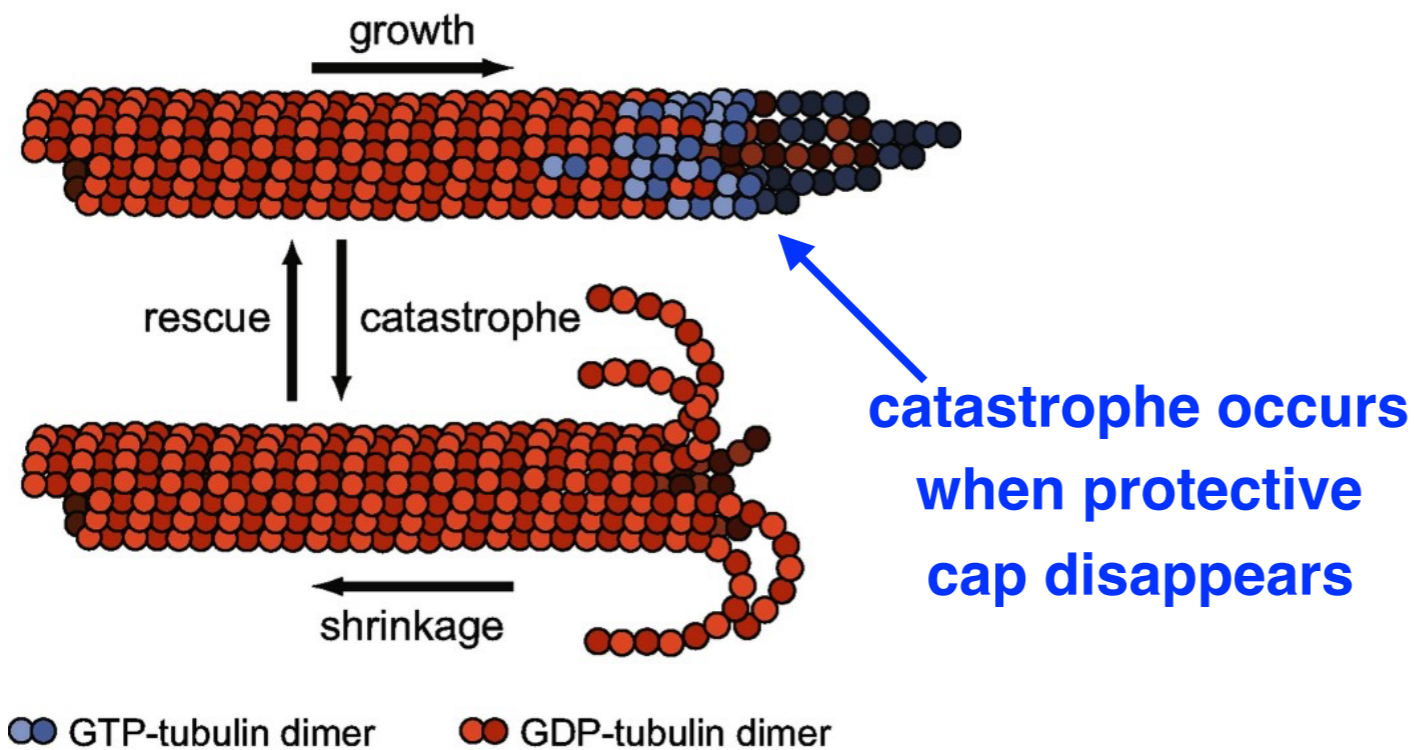
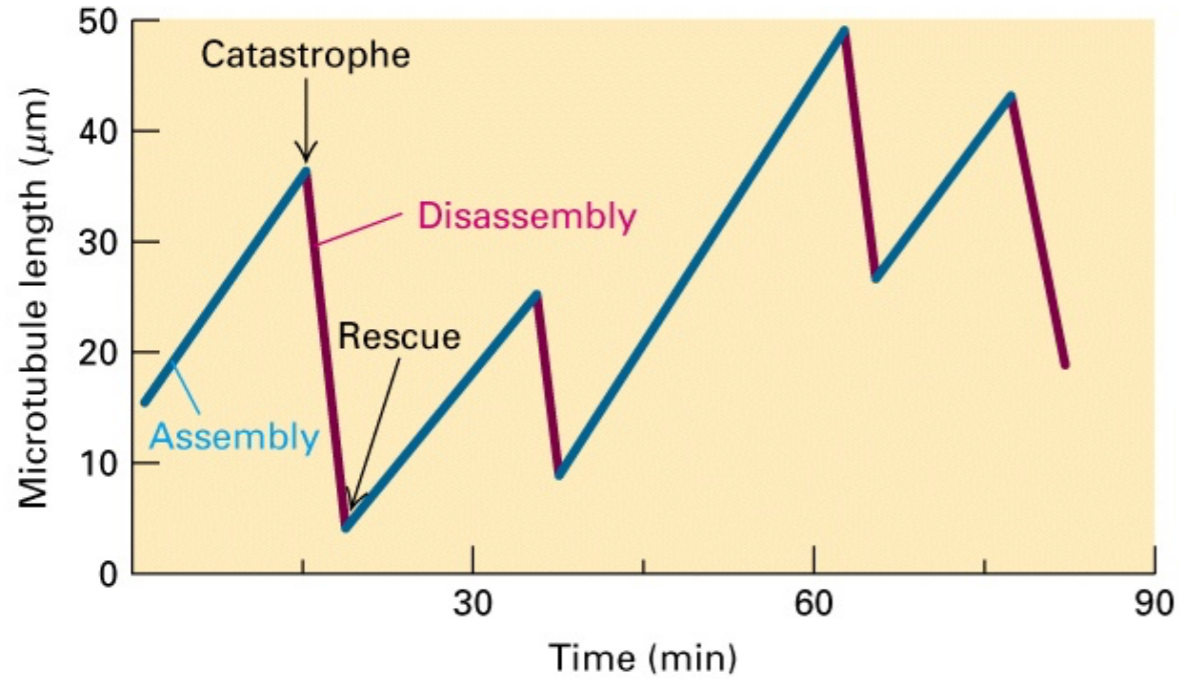
# Microtubules



**Persistence length**  $\ell_p \sim 1\text{mm}$

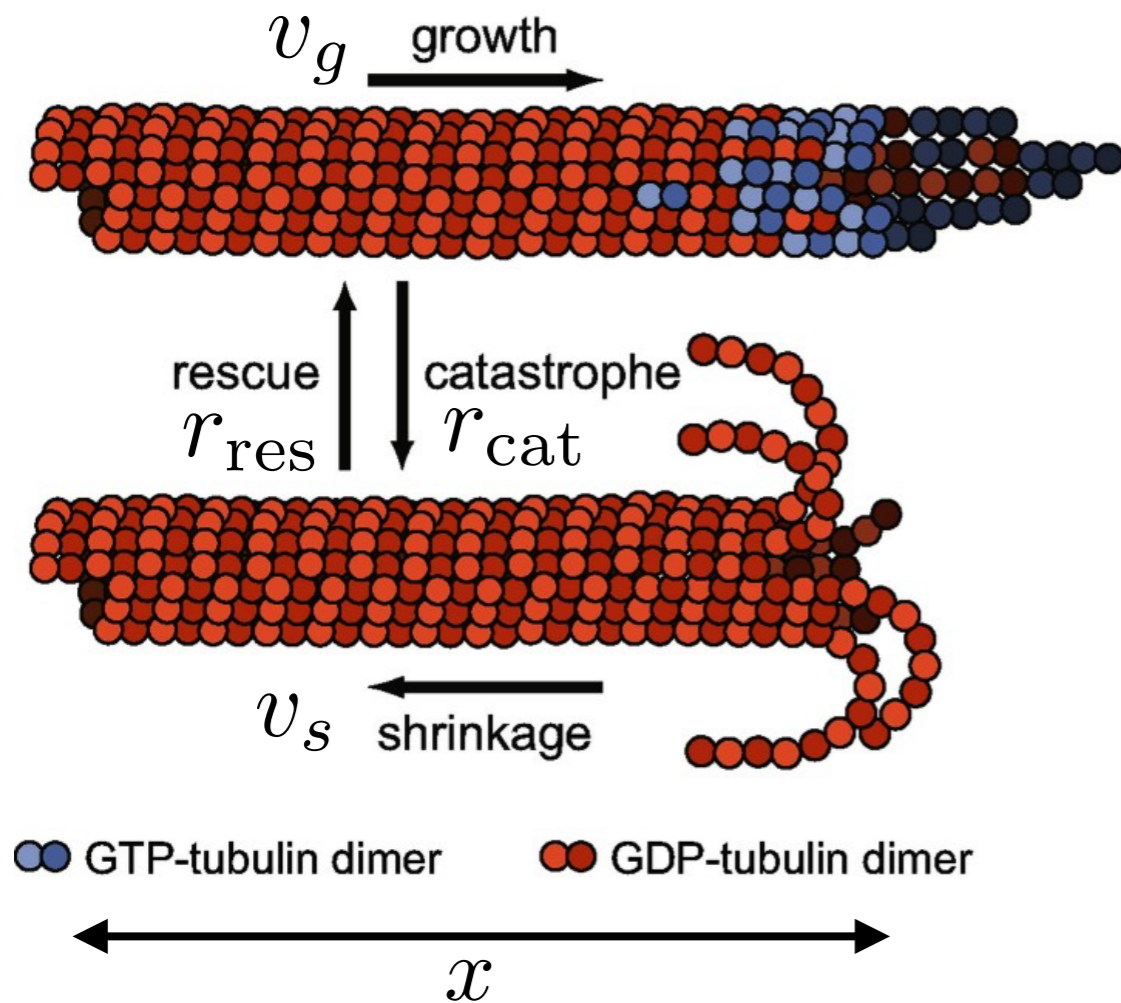
**Typical length**  $L \lesssim 50\mu\text{m}$

# Microtubule dynamic instability



Wikipedia

# Simple model of microtubule growth



Let's ignore all molecular details and assume that microtubules switch at fixed rates between growing and shrinking phases

**Master equation:**

$$\frac{\partial p_{\text{growth}}}{\partial t} = -r_{\text{cat}} p_{\text{growth}} + r_{\text{res}} p_{\text{shrinking}}$$

$$\frac{\partial p_{\text{shrinking}}}{\partial t} = +r_{\text{cat}} p_{\text{growth}} - r_{\text{res}} p_{\text{shrinking}}$$

$$p_{\text{growth}} + p_{\text{shrinking}} = 1$$

**Steady state ( $\partial p / \partial t \equiv 0$ ):**

$$p_{\text{growth}}^* = \frac{r_{\text{res}}}{r_{\text{res}} + r_{\text{cat}}} \quad p_{\text{shrinking}}^* = \frac{r_{\text{cat}}}{r_{\text{res}} + r_{\text{cat}}}$$

**Average growth speed of microtubules**

$$\bar{v} = p_{\text{growth}}^* v_g - p_{\text{shrinking}}^* v_s$$

$$\bar{v} \approx 0.4 \mu\text{m}/\text{min}$$

**Typical values in a tubulin solution**

**of concentration  $[T] \approx 10 \mu\text{M}$  :**

$$v_g \approx 2 \mu\text{m}/\text{min} \quad \propto [T]$$

$$v_s \approx 20 \mu\text{m}/\text{min} \quad \sim \text{const}$$

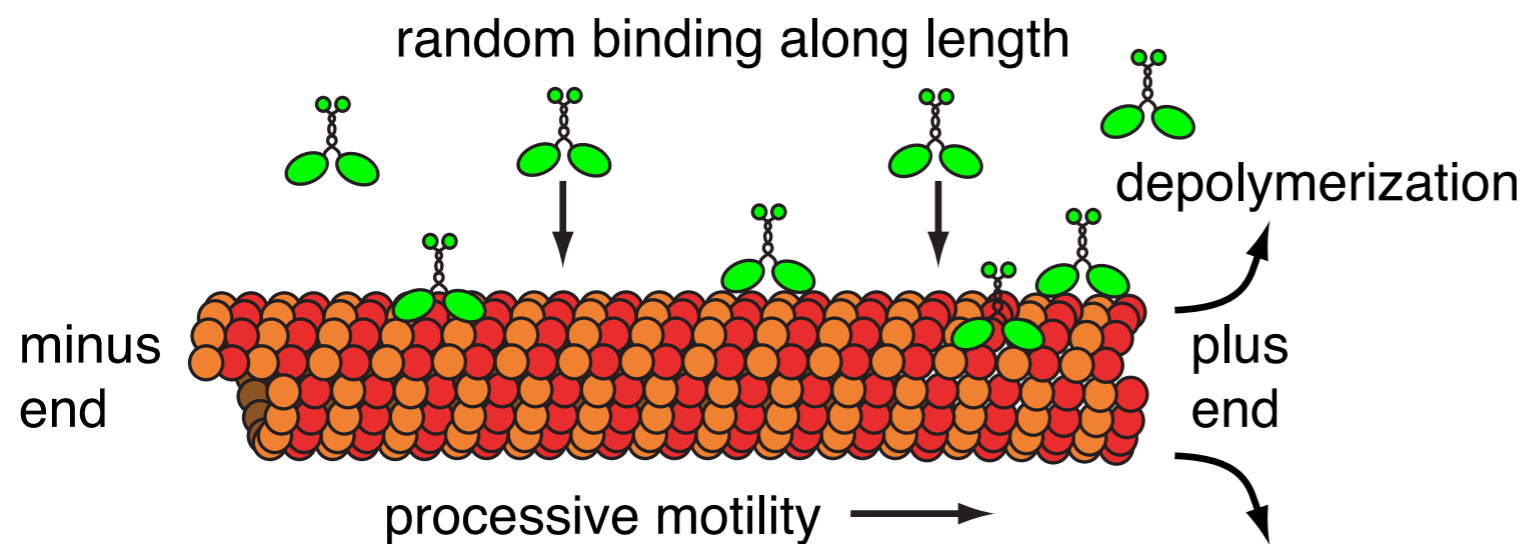
$$r_{\text{cat}} \approx 0.24 \text{min}^{-1} \quad \sim \text{const}$$

$$r_{\text{res}} \approx 3 \text{min}^{-1} \quad \propto [T]$$



# How cells control the total length of microtubules

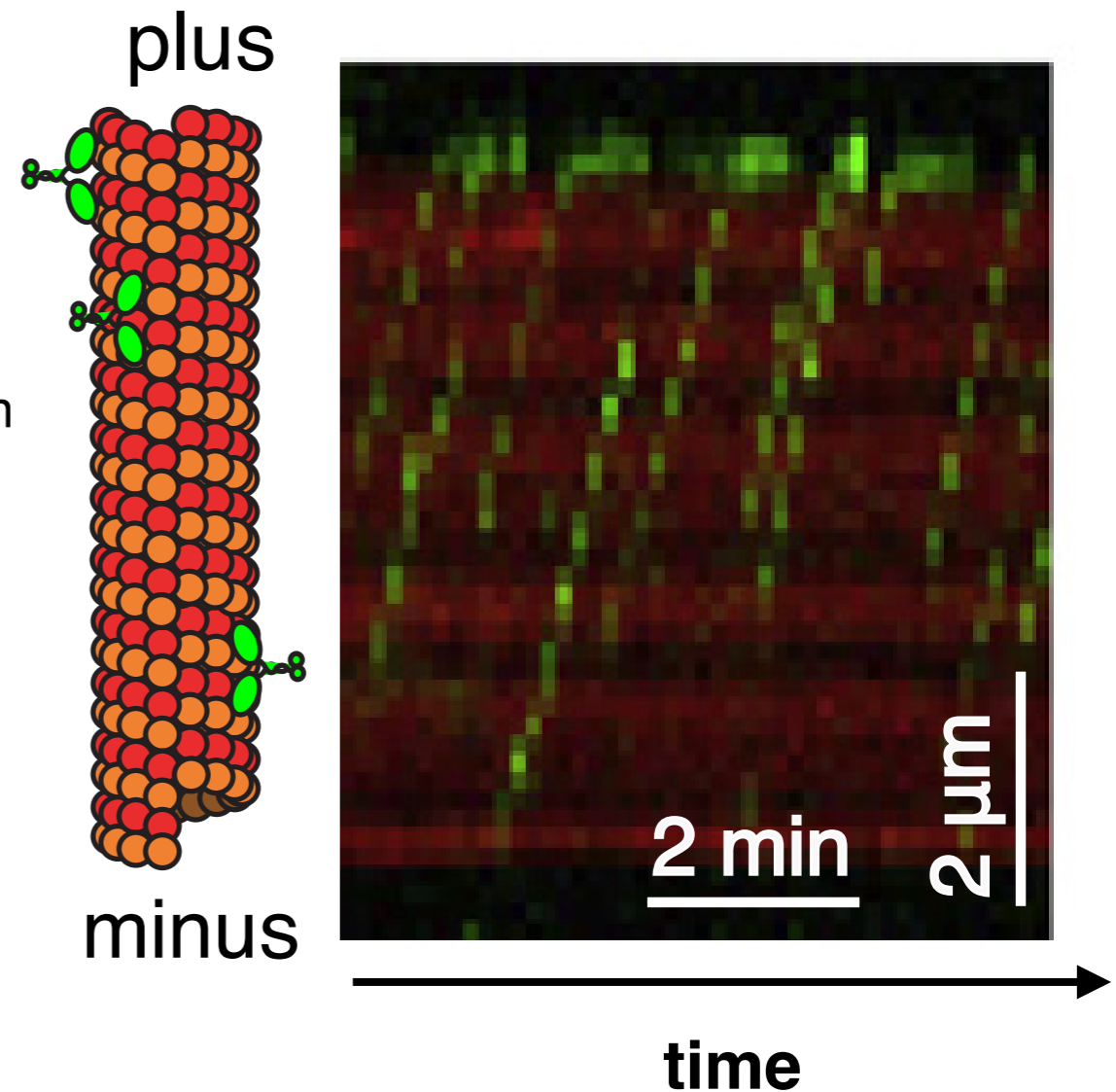
Special kinesin-8 motors bind to microtubules and then walk towards the plus end, where they help detach (depolymerize) tubulin dimers



**Motors walk at speed**

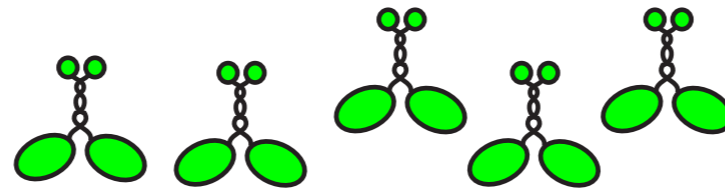
$$v_{\text{mot}} \approx 3 \mu\text{m}/\text{min}$$

**kymograph**  
 $v_{\text{mot}} \approx 3 \mu\text{m}/\text{min}$



# Density of motors bound to microtubules

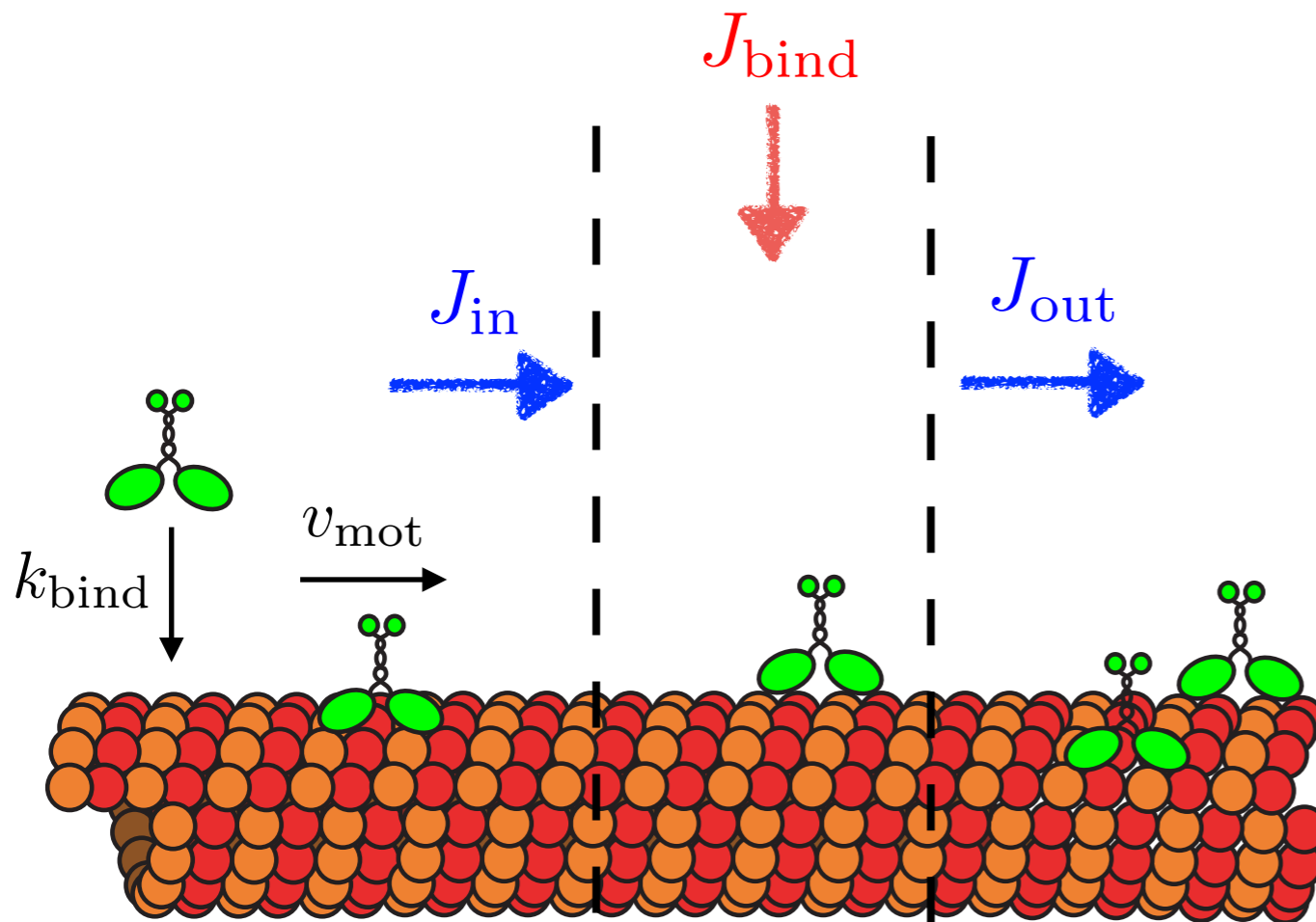
$[M]$  concentration  
of unbound motors



Conservation law for the  
number of bound motors

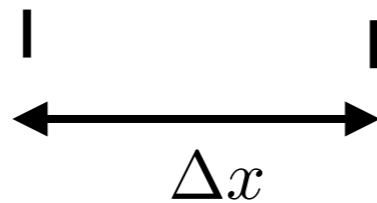
$$\frac{\Delta N}{\Delta t} = J_{\text{bind}} - J_{\text{out}} + J_{\text{in}}$$

$$\frac{\Delta N(x, t)}{\Delta t} = k_{\text{bind}}[M]\Delta x - (\rho(x + \Delta x, t) - \rho(x, t))v_{\text{mot}}$$



$$\rho(x, t) = \frac{\partial N(x, t)}{\partial x}$$

density of  
bound motors



$$\frac{\partial \rho(x, t)}{\partial t} = k_{\text{bind}}[M] - v_{\text{mot}} \frac{\partial \rho(x, t)}{\partial x}$$

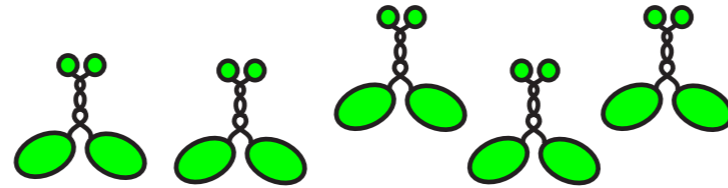
Generalized Fick's law

$$\frac{\partial \rho(x, t)}{\partial t} = r(x, t) - \frac{\partial j(x, t)}{\partial x}$$

creation/removal  
of particles

# Density of motors bound to microtubules

$[M]$  concentration  
of unbound motors



Time evolution for  
density of bound motors

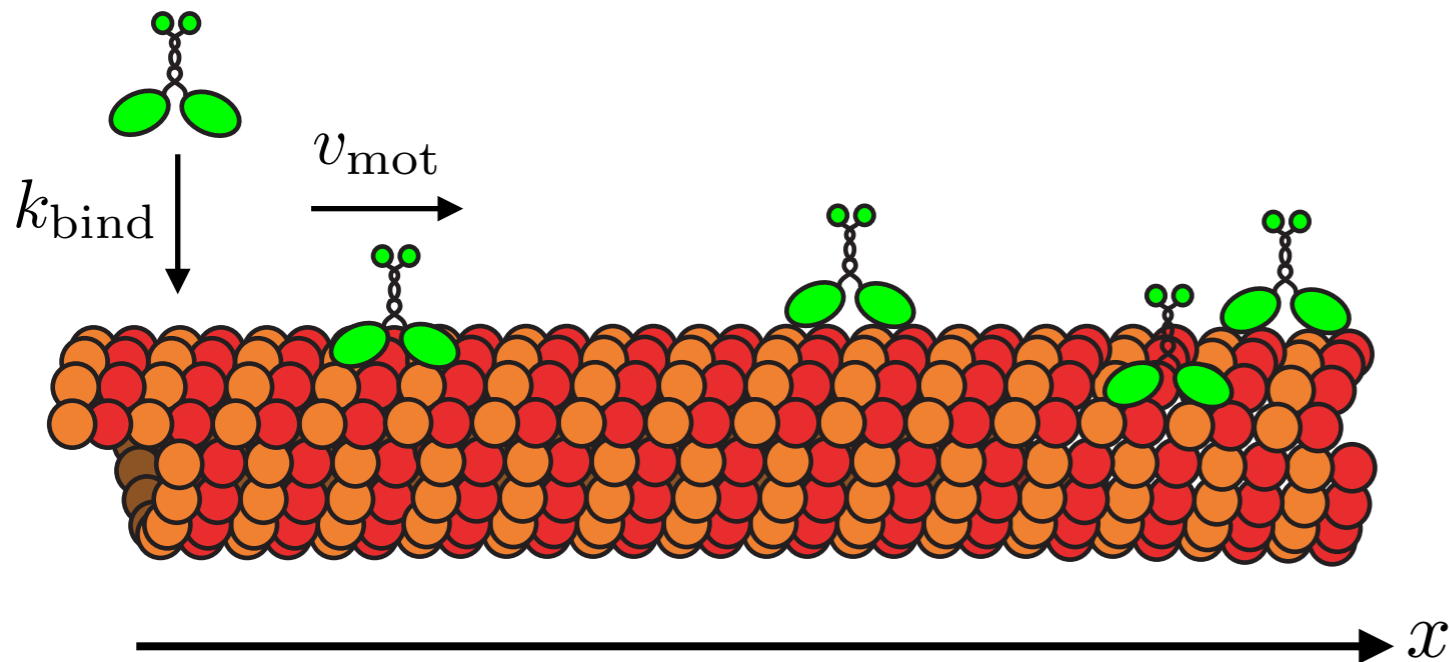
$$\frac{\partial \rho(x, t)}{\partial t} = k_{\text{bind}} [M] - v_{\text{mot}} \frac{\partial \rho(x, t)}{\partial x}$$

For initially empty microtubule

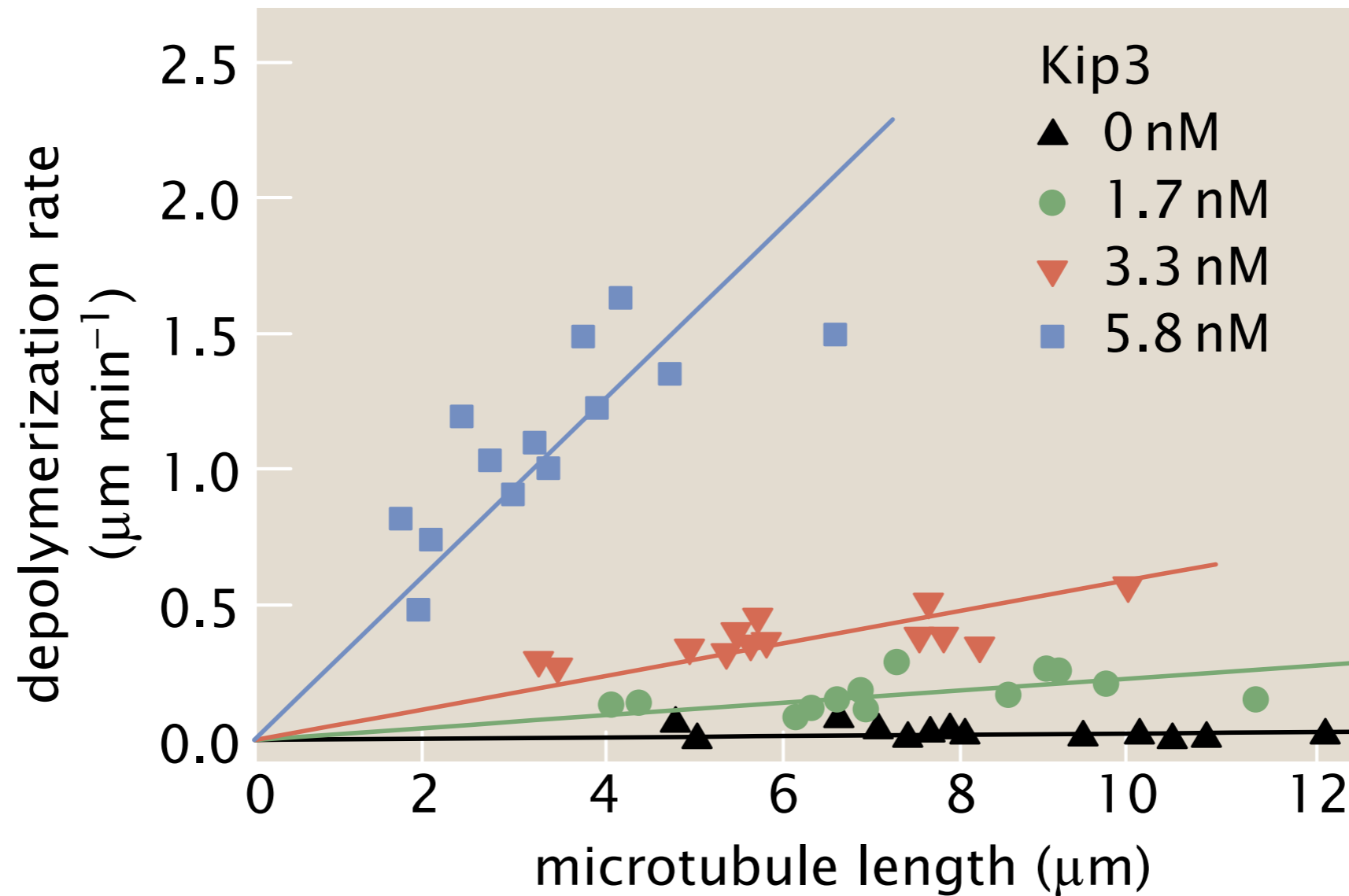
$$\rho(x, t) = \begin{cases} \frac{k_{\text{bind}} [M]}{v_{\text{mot}}} x, & 0 < x < v_{\text{mot}} t \\ k_{\text{bind}} [M] t, & x > v_{\text{mot}} t \end{cases}$$

Stationary density of  
bound motors

$$\rho^*(x) = \frac{k_{\text{bind}} [M]}{v_{\text{mot}}} x$$



# Length dependent depolymerization rate

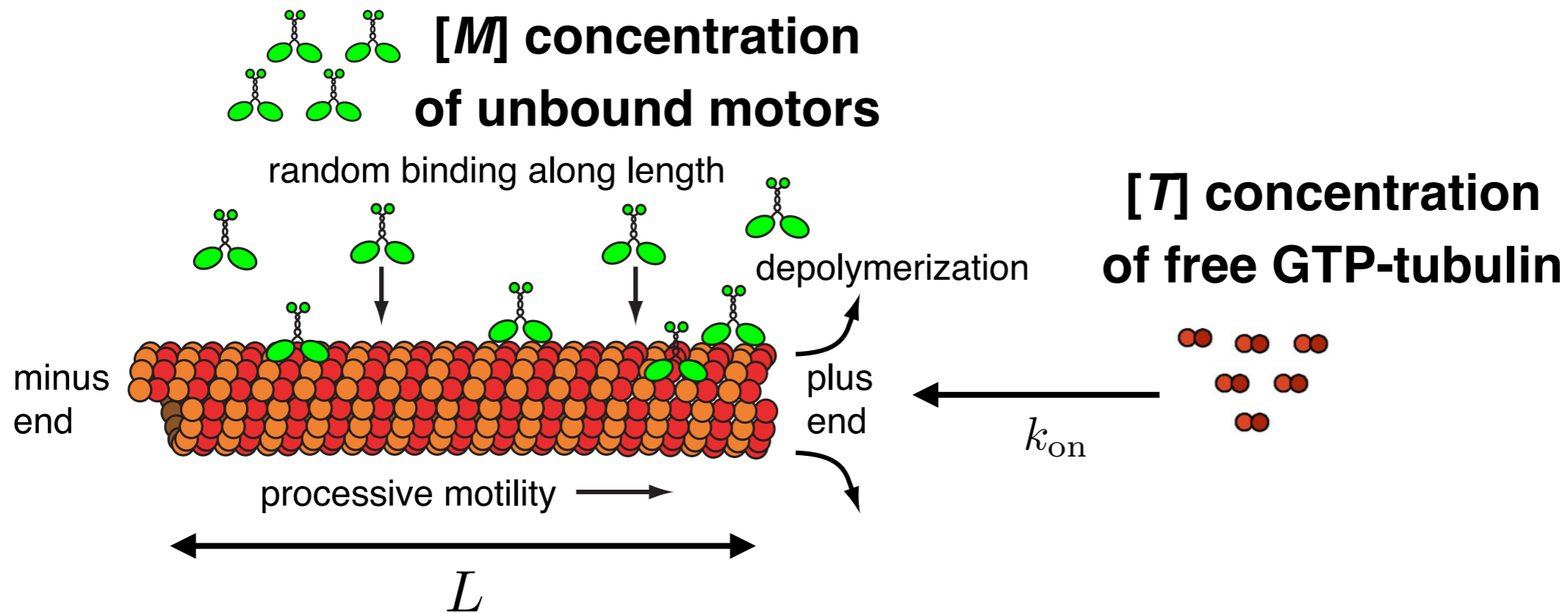


**Depolymerization rate  
is proportional to  
density of Kip3 motors**

$$\rho^*(L) = \frac{k_{\text{bind}}[M]}{v_{\text{mot}}} L$$

V. Varga *et al.*, *Nat. Cell Biol.* **8**, 957-962 (2006)

# Controlled length of microtubules



relative velocity of motors  
arriving to the tip

Stationary length  
of microtubules

$$\frac{dL}{dt} = ak_{\text{on}}[T] - a\rho^*(L) \left[ v_{\text{mot}} - \frac{dL}{dt} \right]$$

$$\frac{dL}{dt} = \frac{(ak_{\text{on}}[T] - a\rho^*(L)v_{\text{mot}})}{1 - a\rho^*(L)}$$

$$\rho^*(L) = \frac{k_{\text{bind}}[M]}{v_{\text{mot}}} L$$

$$L^* = \frac{k_{\text{on}}[T]}{k_{\text{bind}}[M]}$$

$$[T] \approx 10\mu\text{M}$$

$$k_{\text{on}} \approx 9\mu\text{M}^{-1}\text{s}^{-1}$$

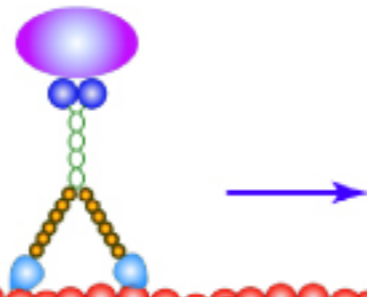
$$[M] \approx 3\text{nM}$$

$$k_{\text{bind}} \approx 24\text{nM}^{-1}\text{min}^{-1}\mu\text{m}^{-1}$$

$$L^* \sim 75\mu\text{m}$$

# Molecular motors

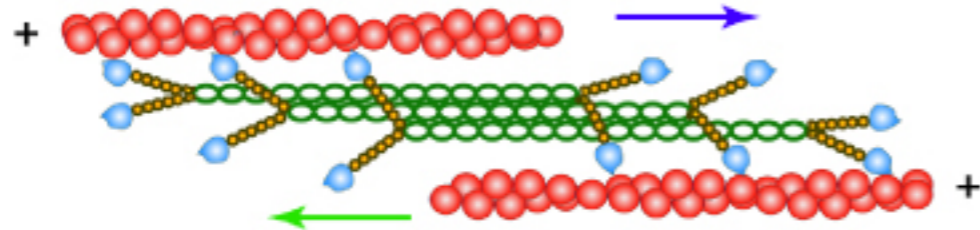
A Myosin V



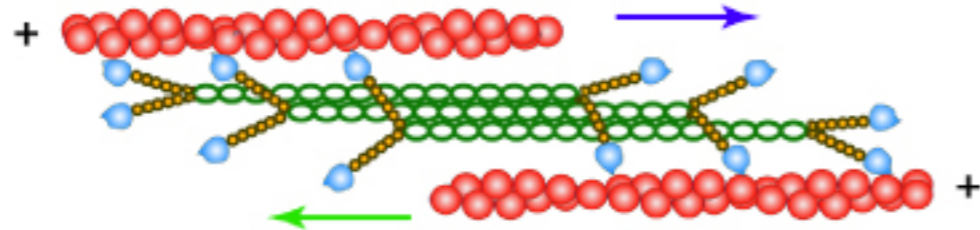
Actin



B Myosin II



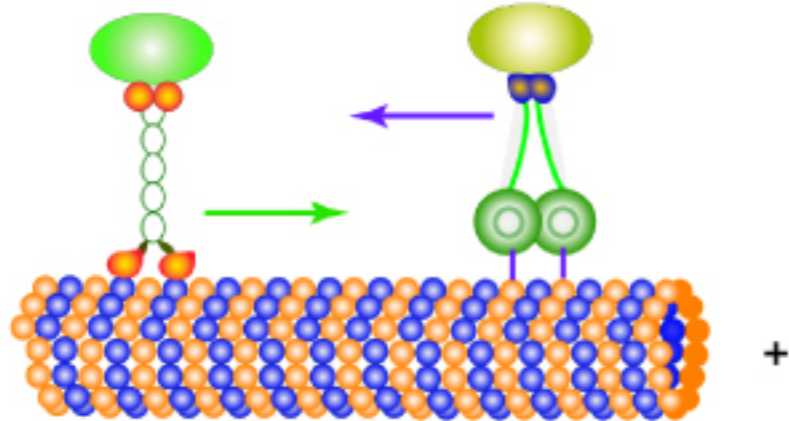
Actin



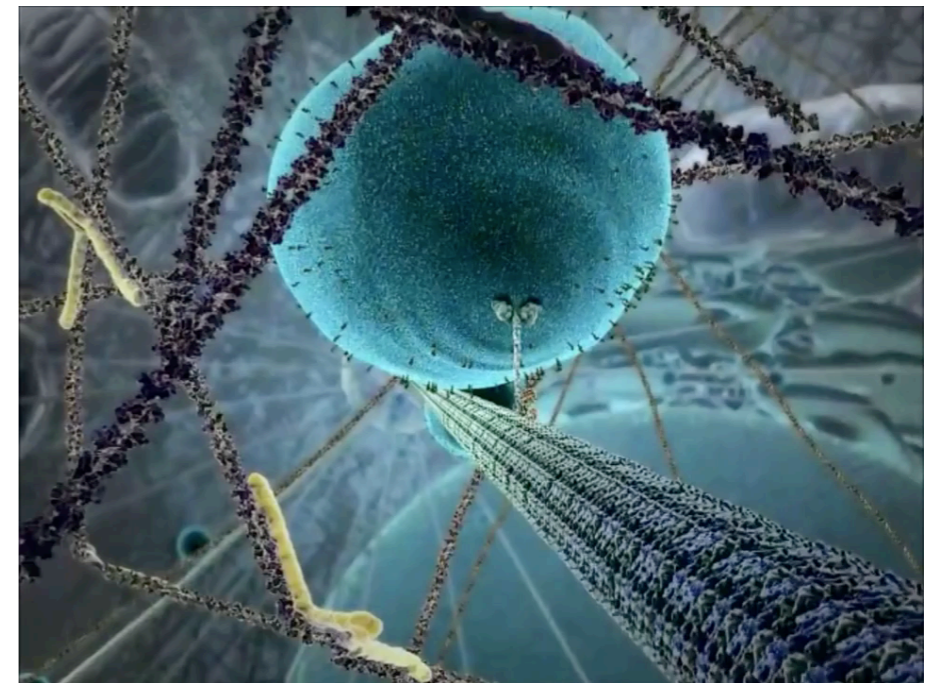
C

Kinesin-1

Dynein



Microtubule



Contraction of muscles

Transport of large molecules around cells  
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$$v \sim 1 \mu\text{m/s}$$

A.B. Kolomeisky, J. Phys.: Condens. Matter **25**, 463101 (2013)

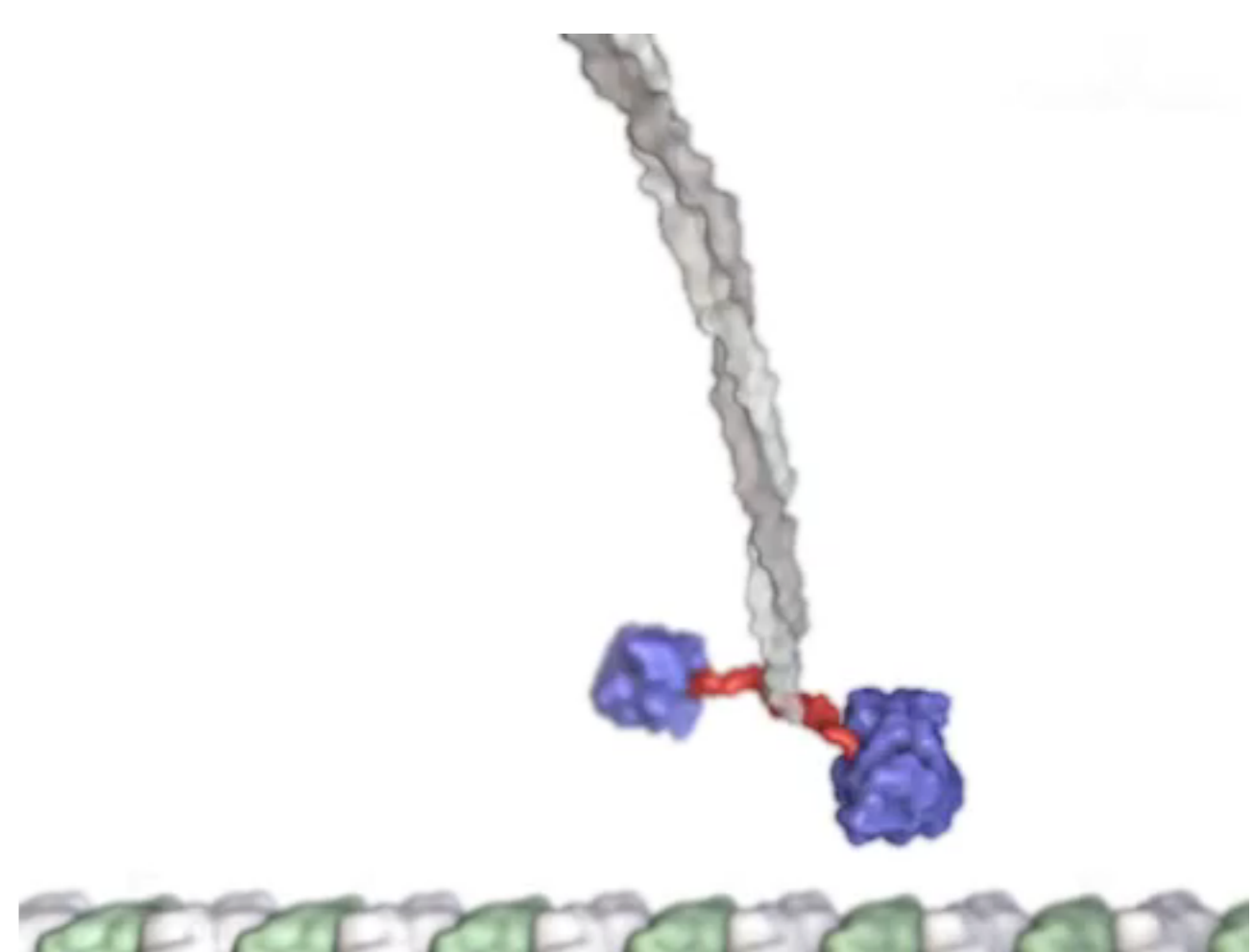
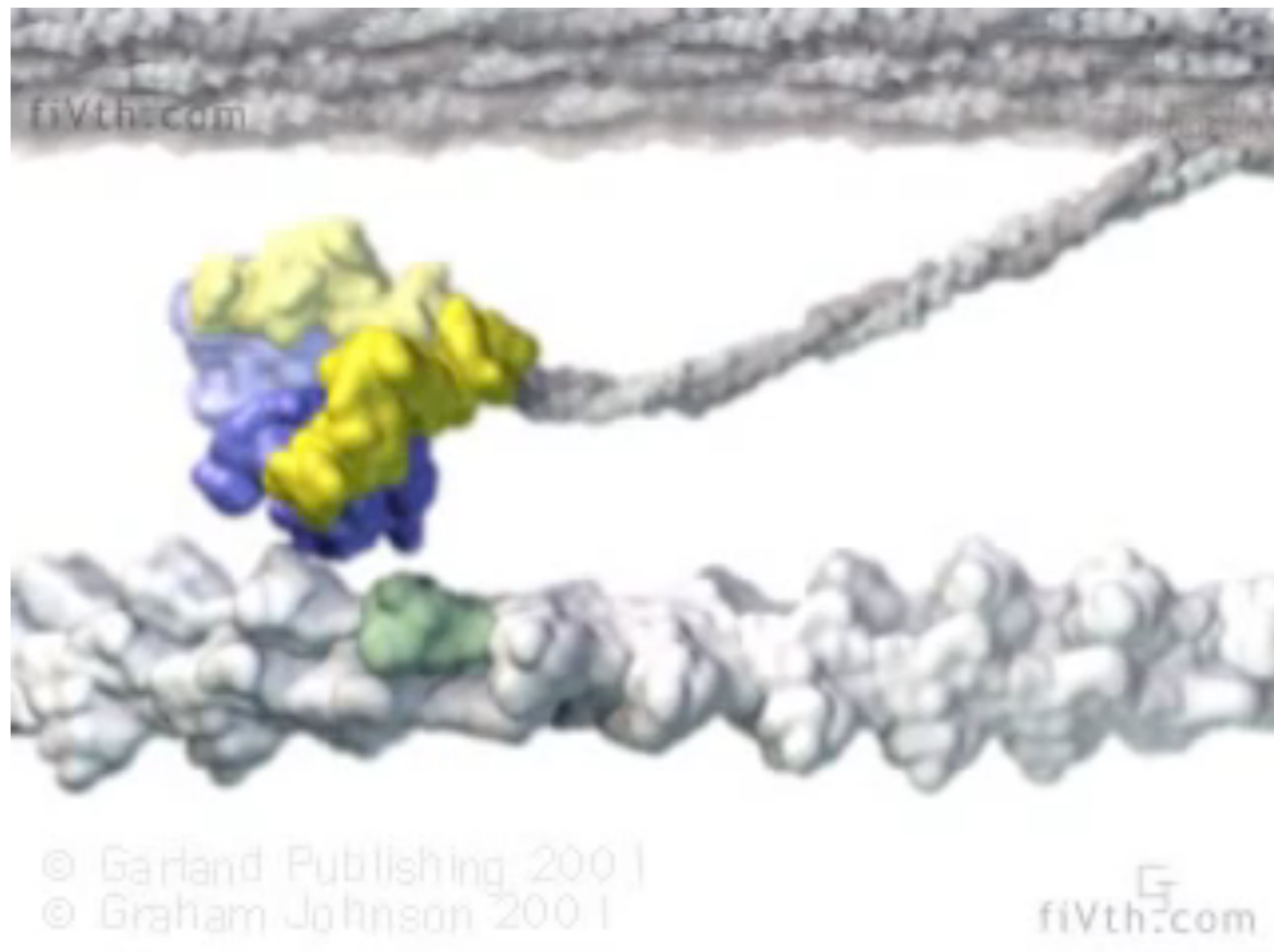
Harvard BioVisions

<https://www.youtube.com/watch?v=FzcTgrxMzZk>

# Movement of molecular motors is powered by ATP molecules

**Myosin motor walking on actin in muscles**

**Kinesin motor walking on microtubule**



**Graham Johnson**

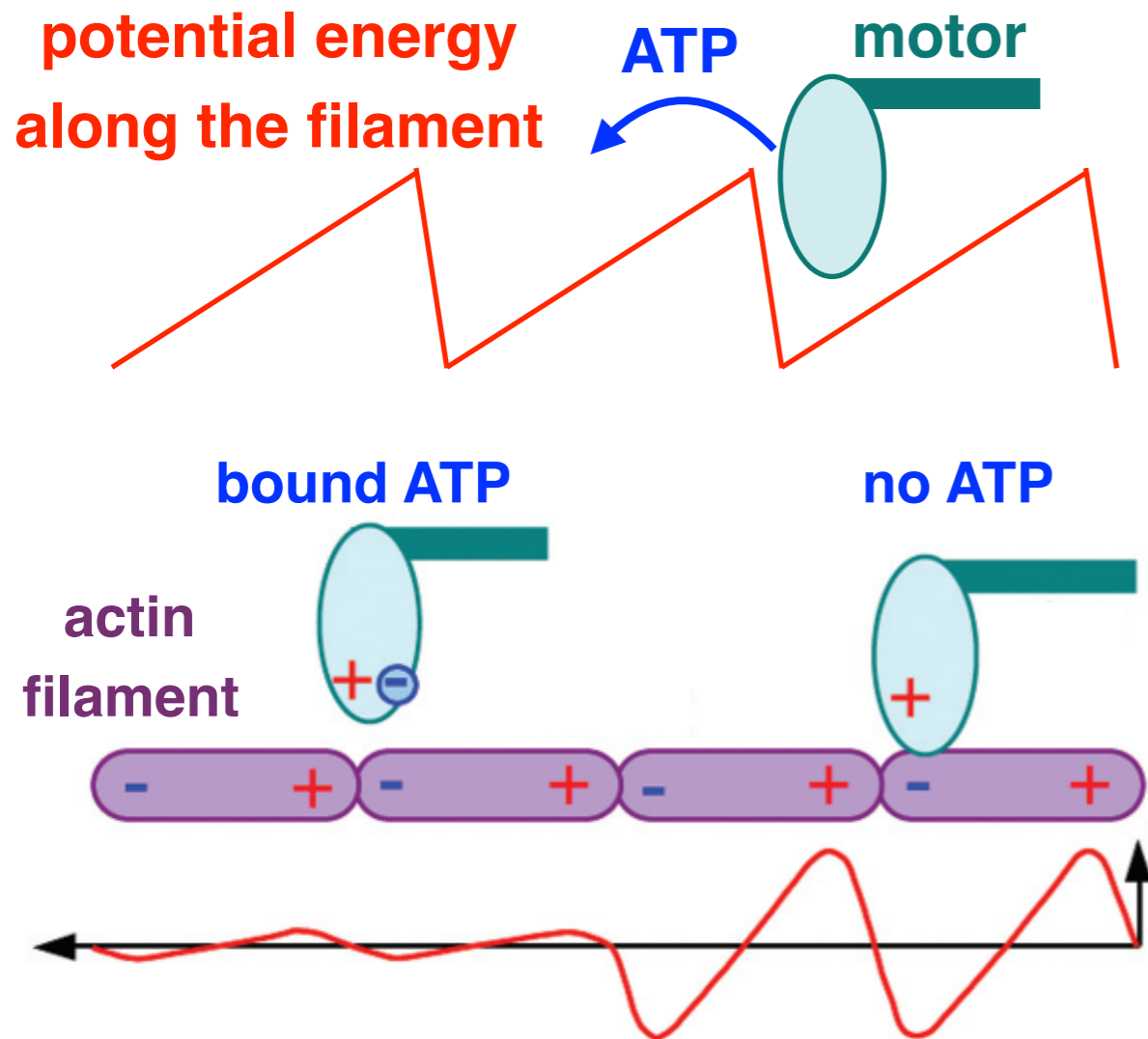
<https://www.youtube.com/watch?v=oHDRIwRZRVI>

<https://www.youtube.com/watch?v=YAva4g3Pk6k>

# Molecular motors vs Brownian ratchets

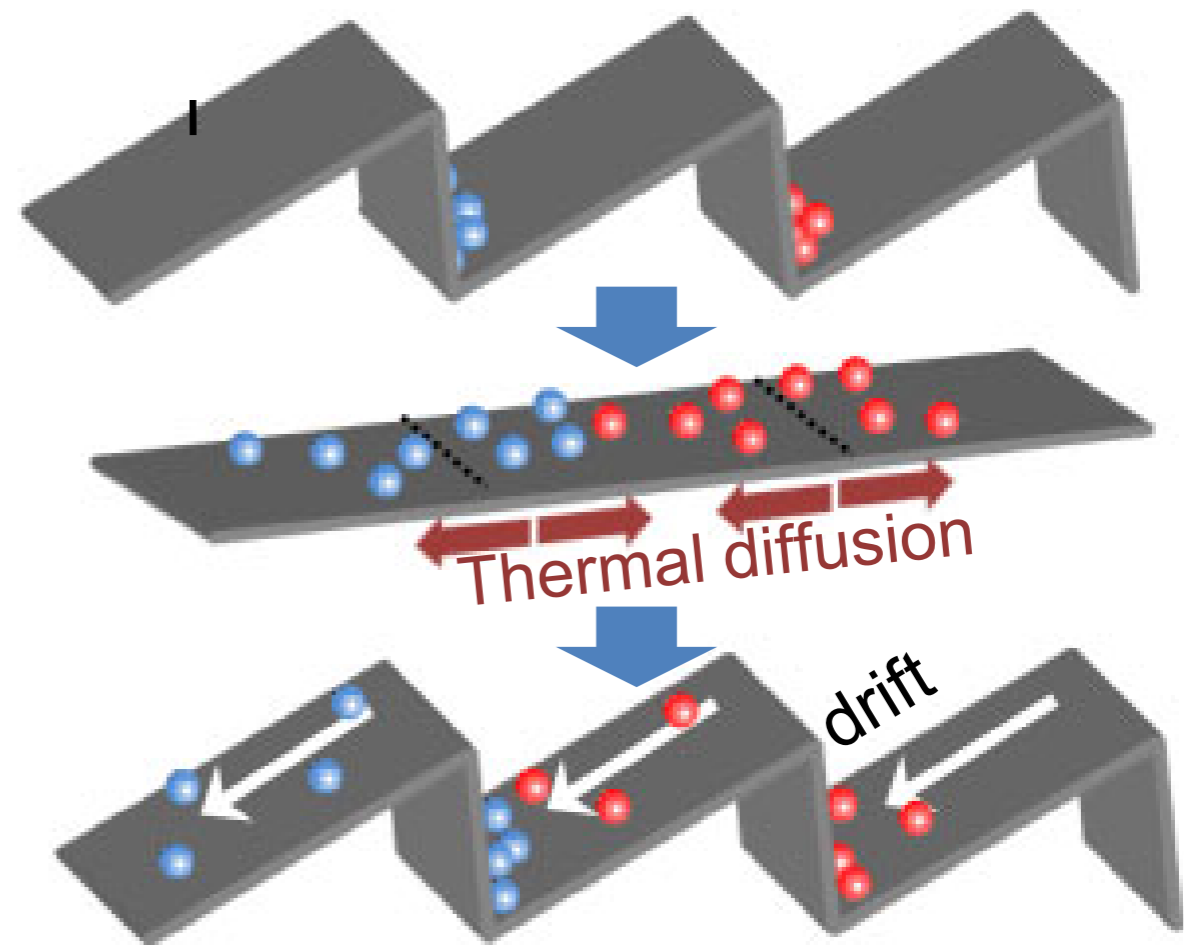
## Myosin motor

ATP driven process  
drives molecular motors  
along the filaments



## Brownian ratchet

net movement of particles is  
achieved by periodic modulation of  
asymmetric external potential

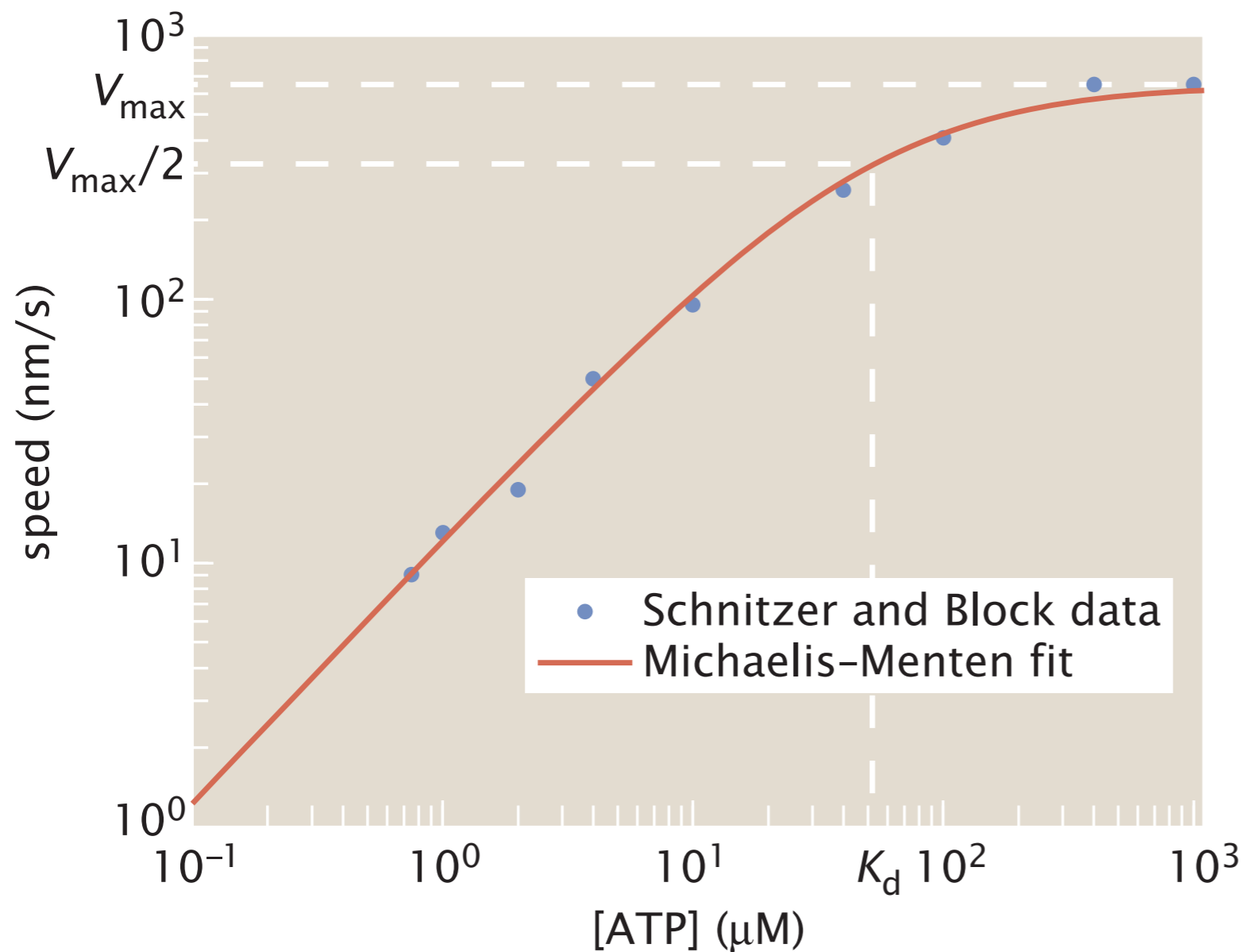




# ATP concentration dependent speed of motors

$$v \approx v_{\max} \frac{[\text{ATP}]}{[\text{ATP}] + K_d}$$

## Kinesin motor on microtubules



**Maximal speed**

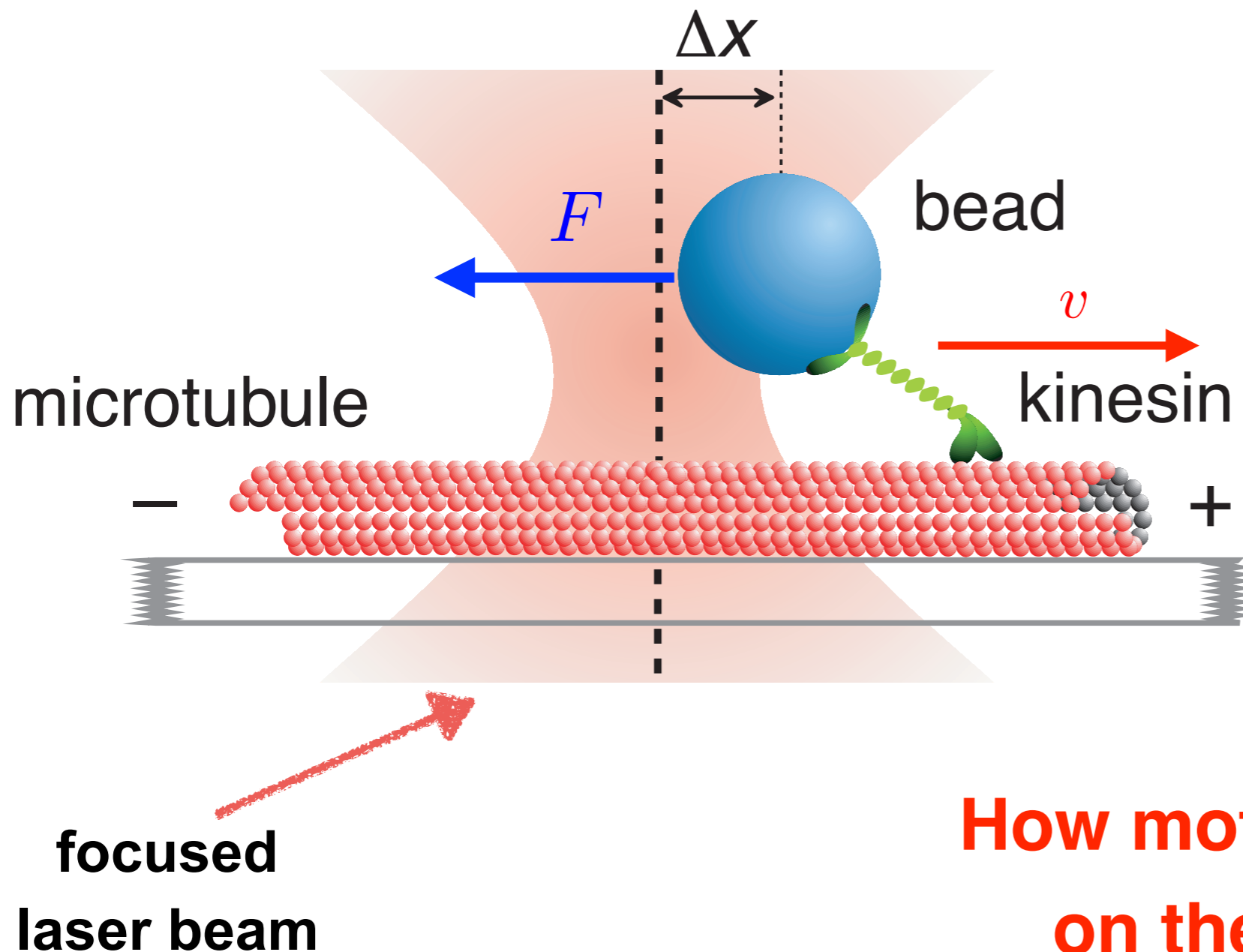
$$v_{\max} \approx 0.6 \mu\text{m/s}$$

**ATP concentration at half the maximal speed**

$$K_d \approx 50 \mu\text{M}$$

# Motors carrying the load

Force exerted on kinesin motors carrying plastic beads can be controlled with optical tweezers



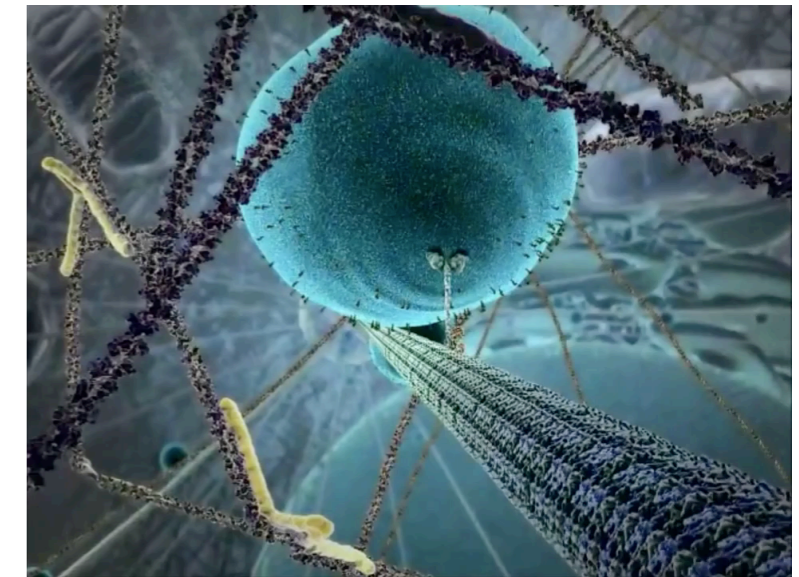
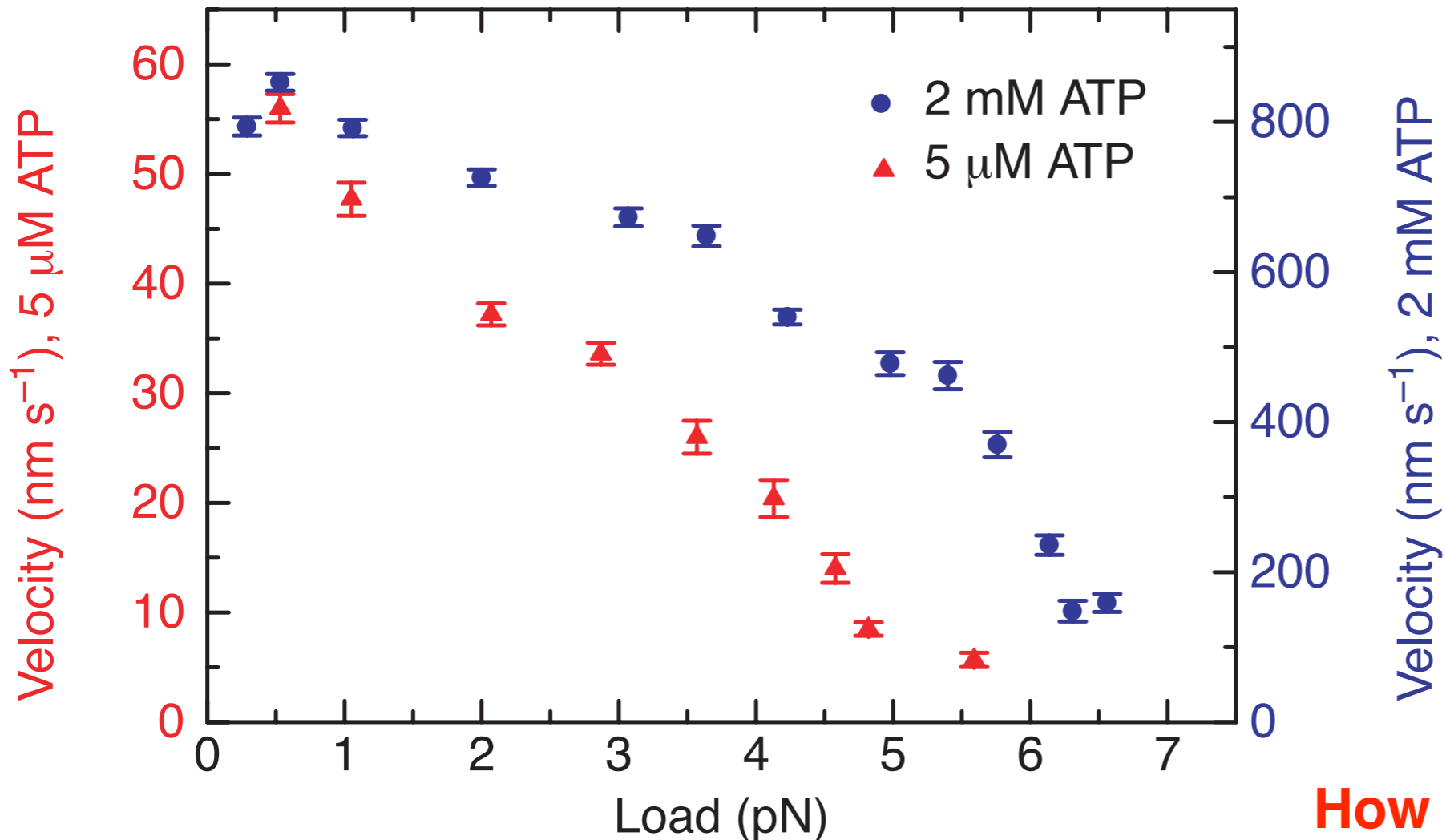
$$F \approx k\Delta x$$

Effective spring constant  $k$  depends on the bead size, refractive indices of the bead and surrounding medium, and the gradient of laser intensity

How motor speed depends on the loading force?

# Motor velocity dependence on the load

## kinesin walking on microtubules



**How important is viscous drag for motors carrying vesicles?**

**stall force**

$$v(F_s) = 0$$

$$F_{\text{drag}} = 6\pi\eta Rv$$

$$F_{\text{drag}} \sim 6\pi \cdot 10^{-3} \text{kgm}^{-1}\text{s}^{-1} \cdot 1\mu\text{m} \cdot 1\mu\text{m}/\text{s}$$

$$F_{\text{drag}} \sim 10^{-2} \text{pN}$$

# ATP concentration dependent stall force

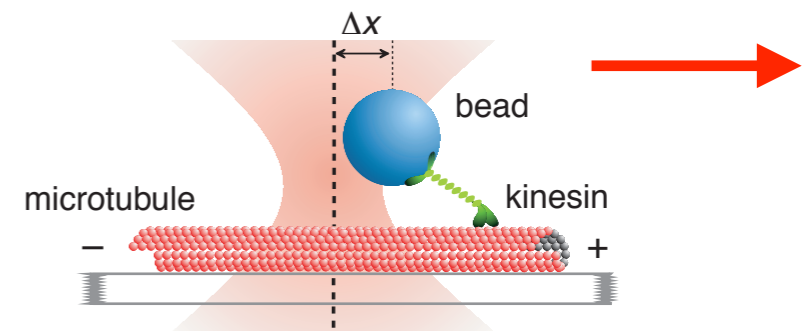
$$F_s \sim \frac{k_B T}{a} \ln[\text{ATP}]$$

motor step length

$$a \approx 8 \text{ nm}$$

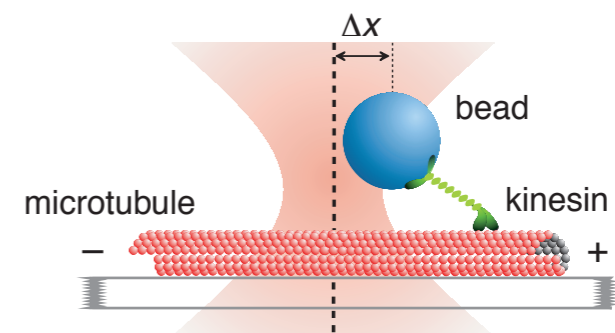
**Position clamp**

laser follows the bead  
and keeps fixed force

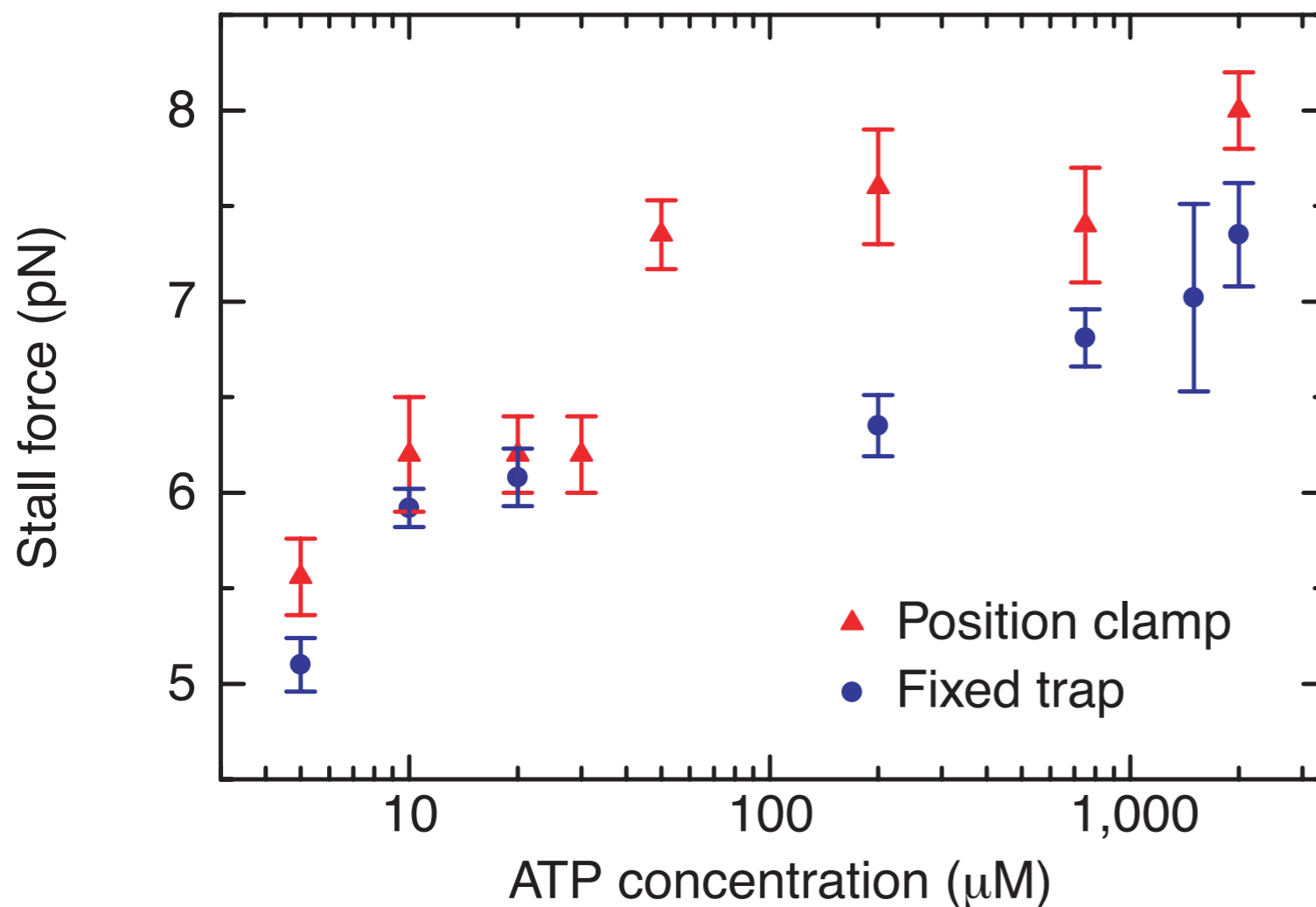


**Fixed trap**

laser position is fixed



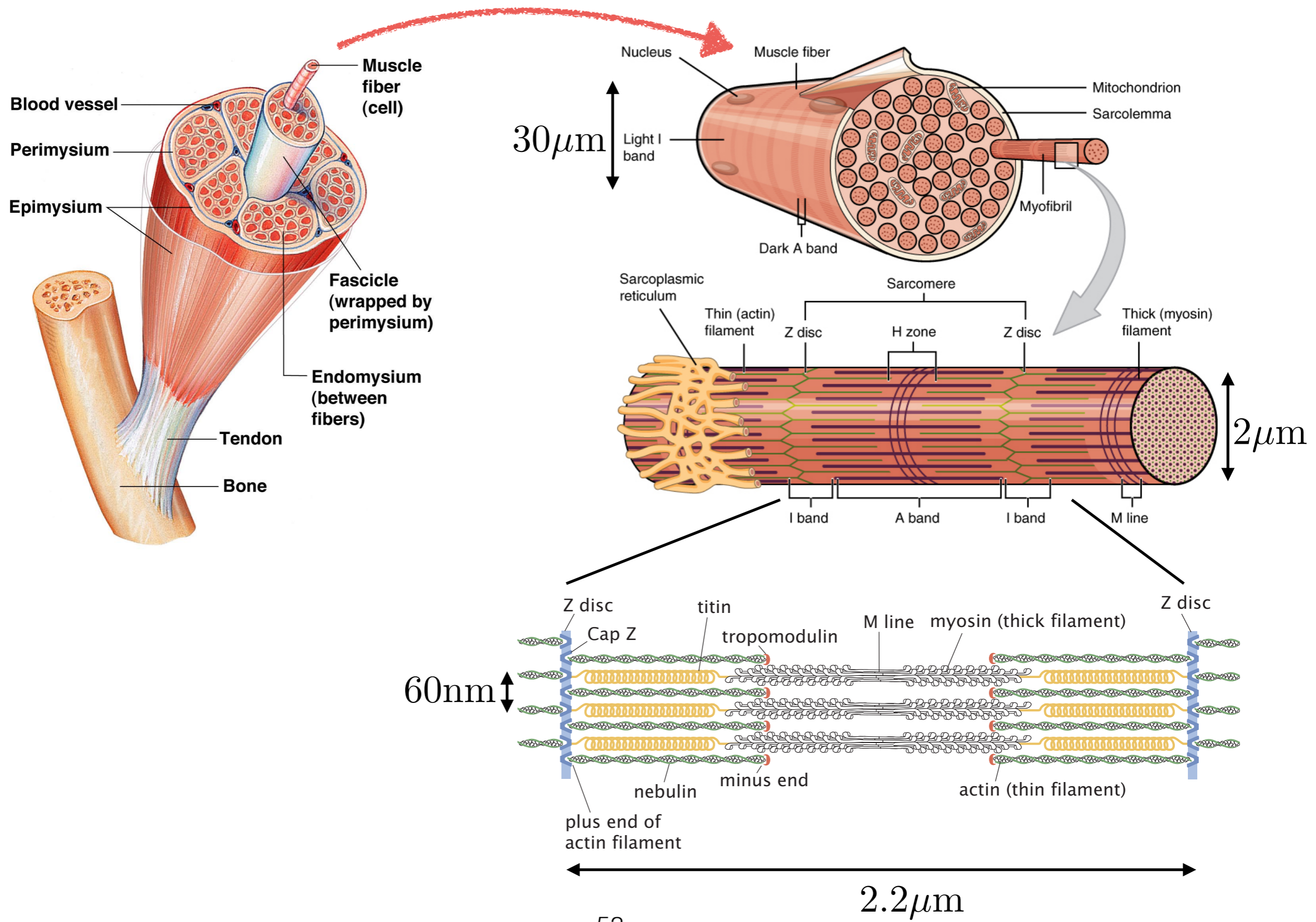
## kinesin walking on microtubules



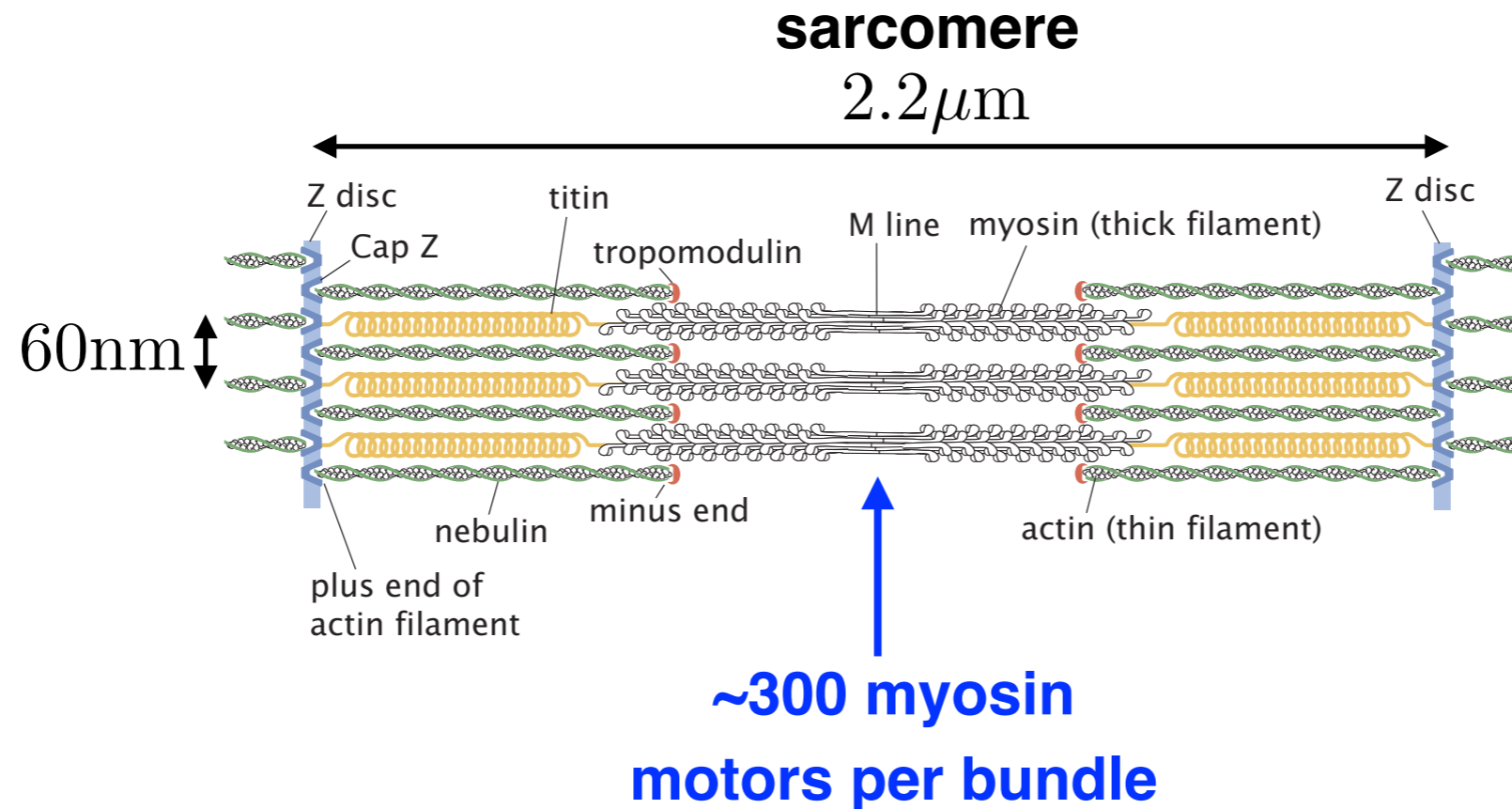
maximal possible force exerted by motors can  
be estimated from energy conservation

$$F_{\max} = \frac{\Delta G_{\text{ATP}}}{a} \approx \frac{20k_B T}{8 \text{ nm}} \sim 10 \text{ pN}$$

# Skeletal muscle contraction by myosin motors



# Skeletal muscle contraction by myosin motors



**Estimated force generated by myosin motors**

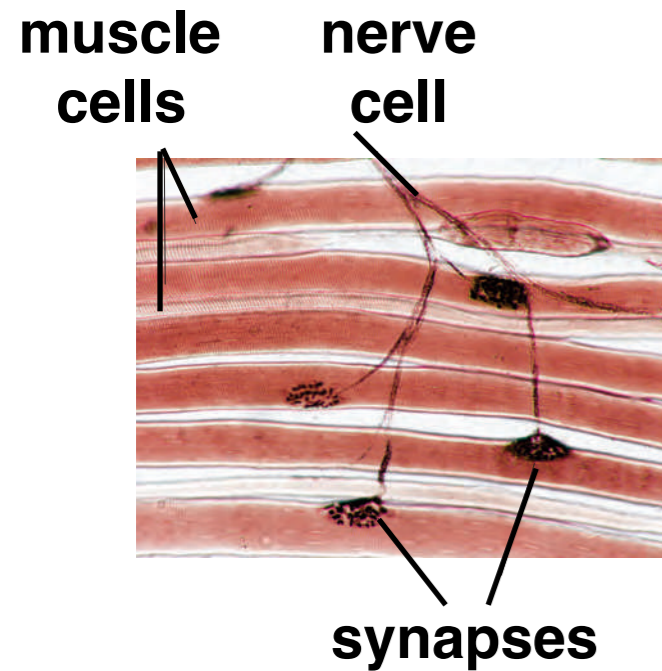
$$300 \times \frac{2\text{pN}}{\pi(30\text{nm})^2} \sim 20\text{N}/\text{cm}^2$$

**Muscles contract at twice the speed of myosin motors**

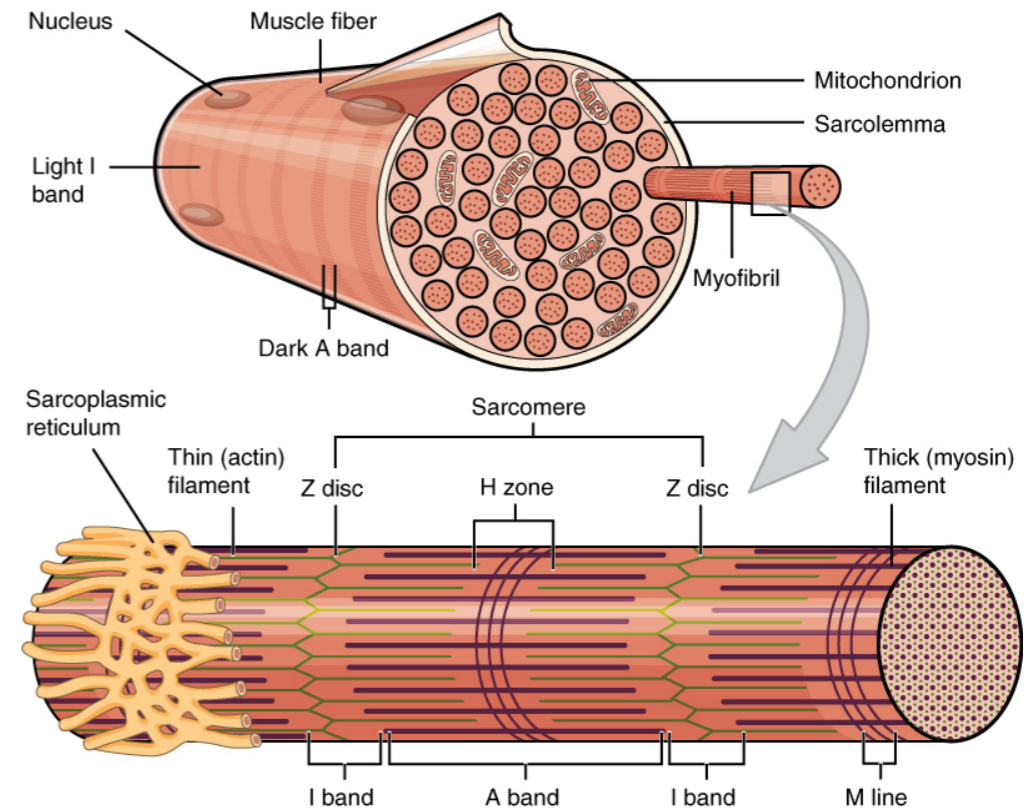
$$\sim 0.1\text{-}1\mu\text{m}/\text{s}$$

**Muscles may contract by 5%-45% per second!**

# Skeletal muscle contraction is controlled by nerve cells

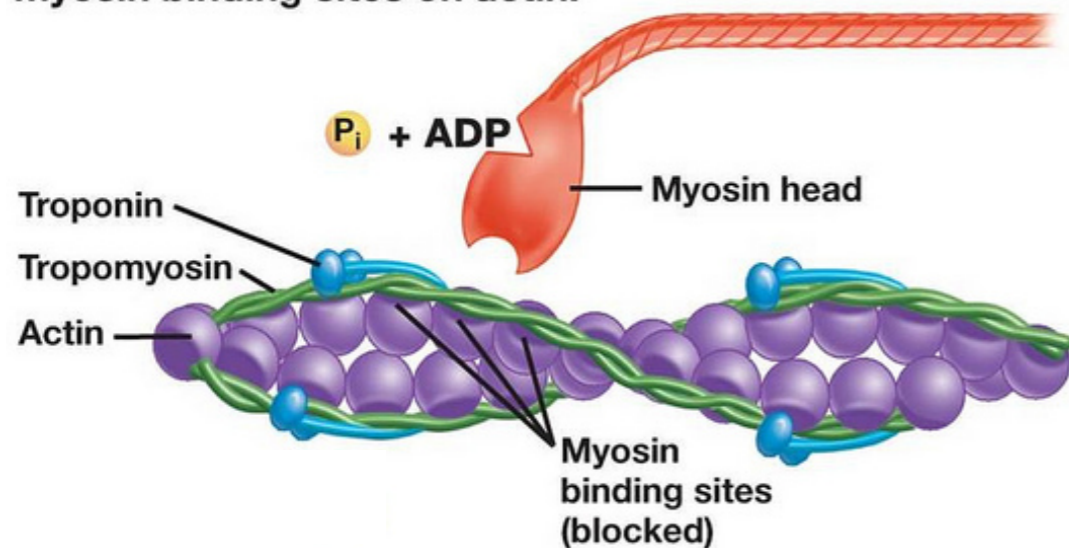


Electric signal from nerve cells releases  $\text{Ca}^{2+}$  from sarcoplasmic reticulum



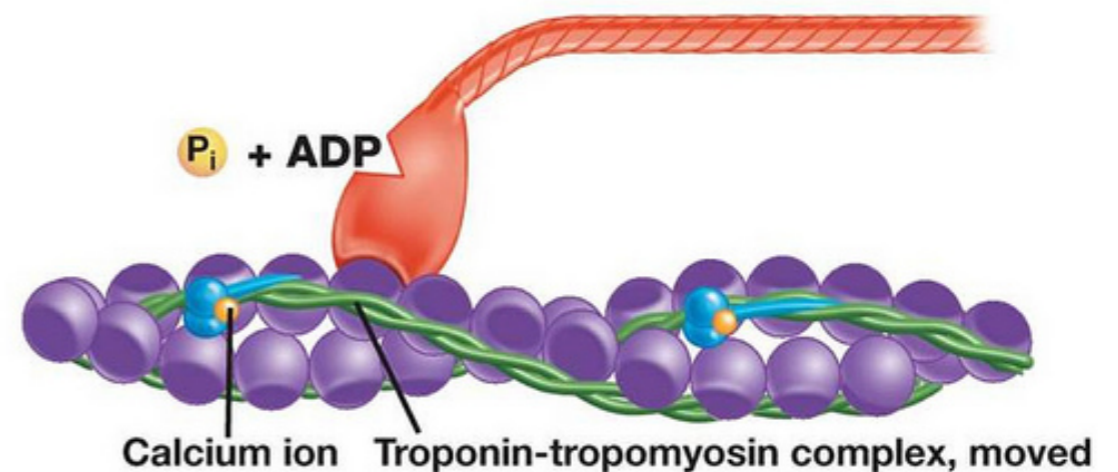
## Low $\text{Ca}^{2+}$ , muscles are relaxed

(a) Tropomyosin and troponin work together to block the myosin binding sites on actin.

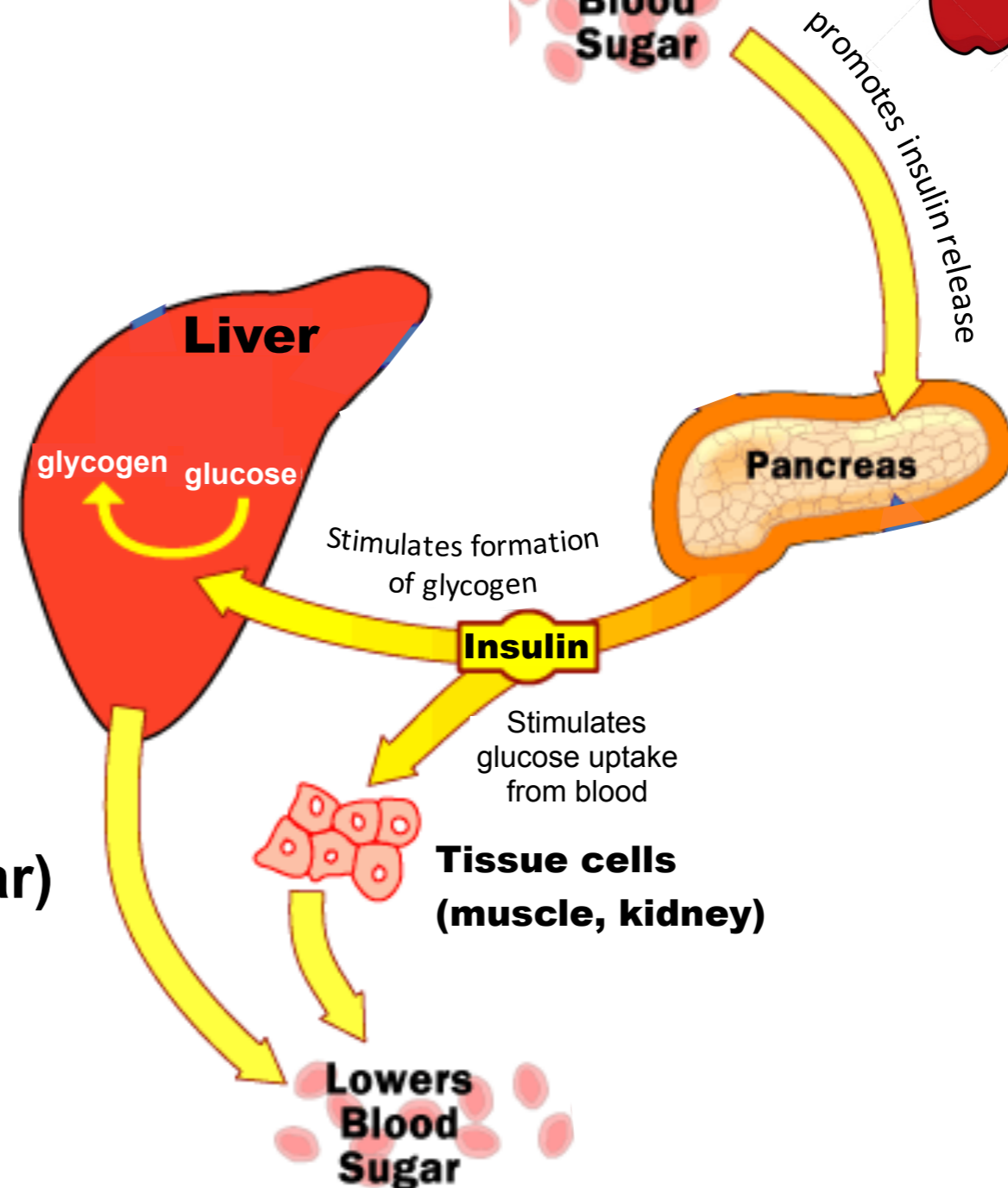
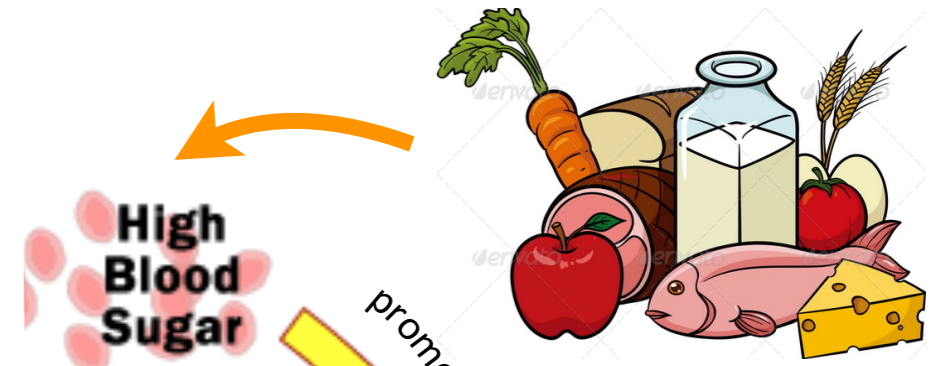
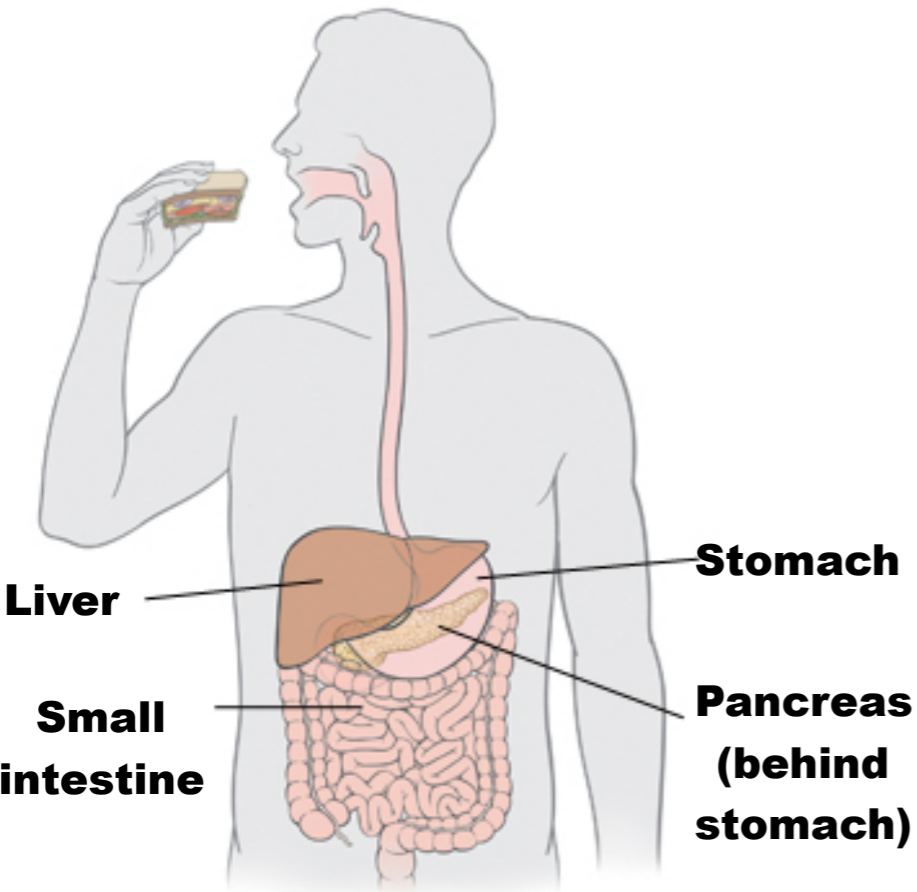


## High $\text{Ca}^{2+}$ , muscles are contracted

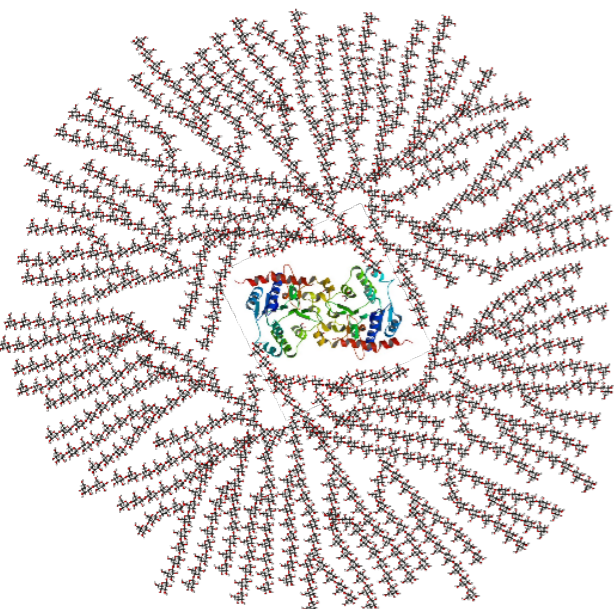
(b) When a calcium ion binds to troponin, the troponin-tropomyosin complex moves, exposing myosin binding sites.



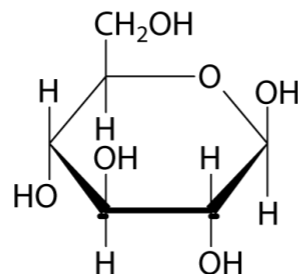
# How muscles get ATP energy?



**glycogen**  
(polysaccharide of glucose)

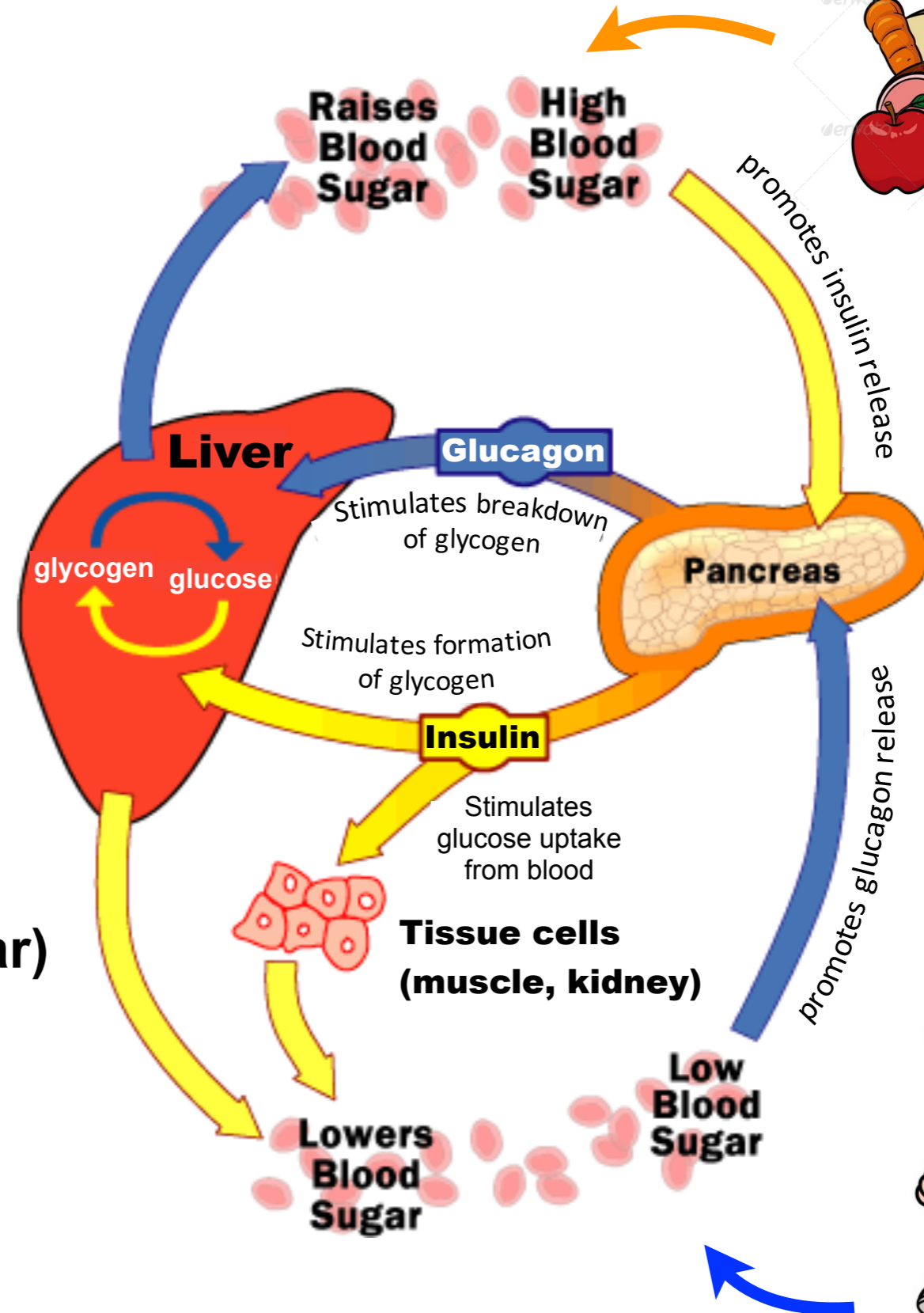
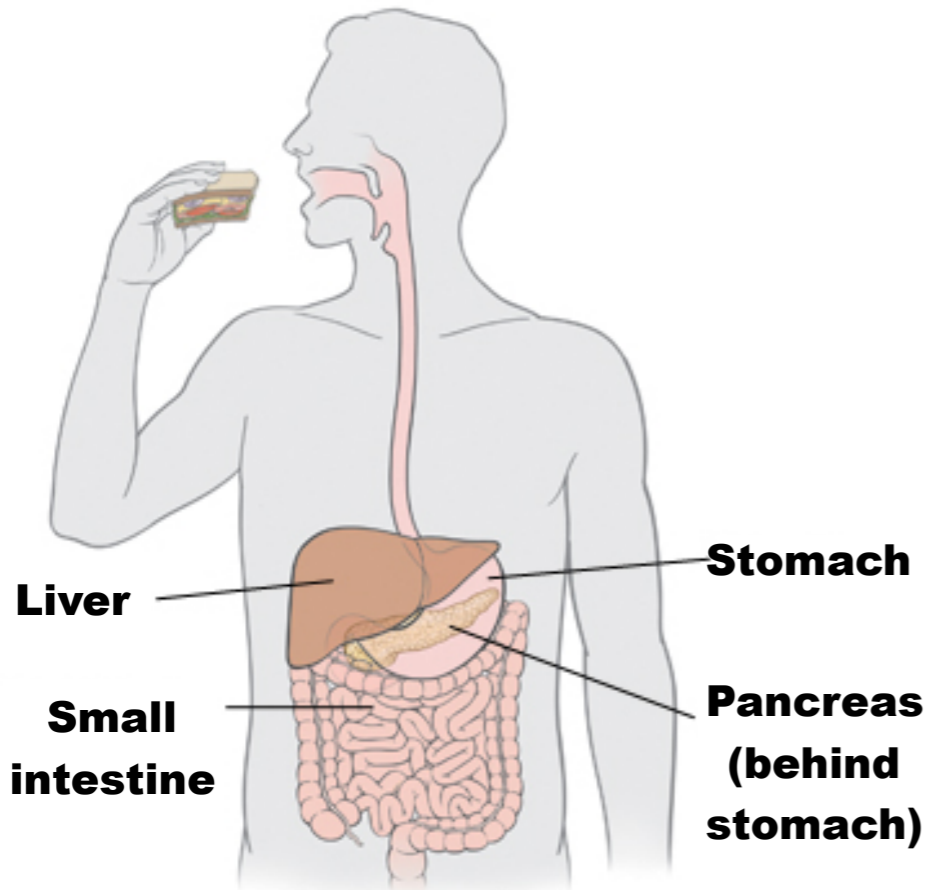


**glucose**  
(blood sugar)

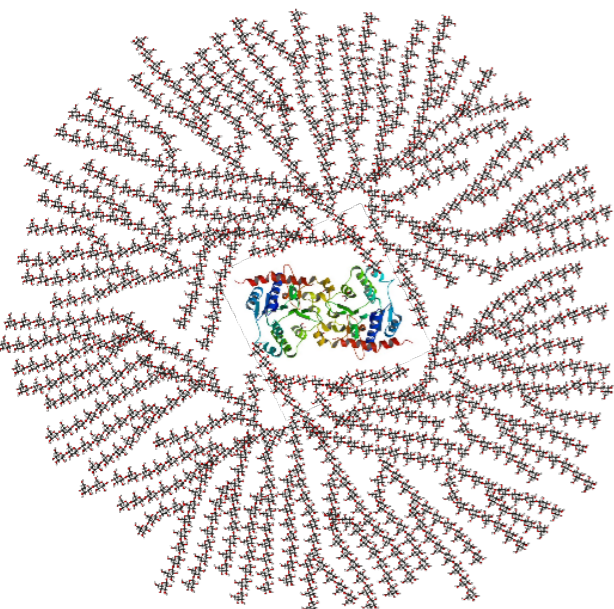




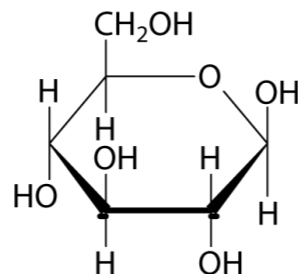
# How muscles get ATP energy?



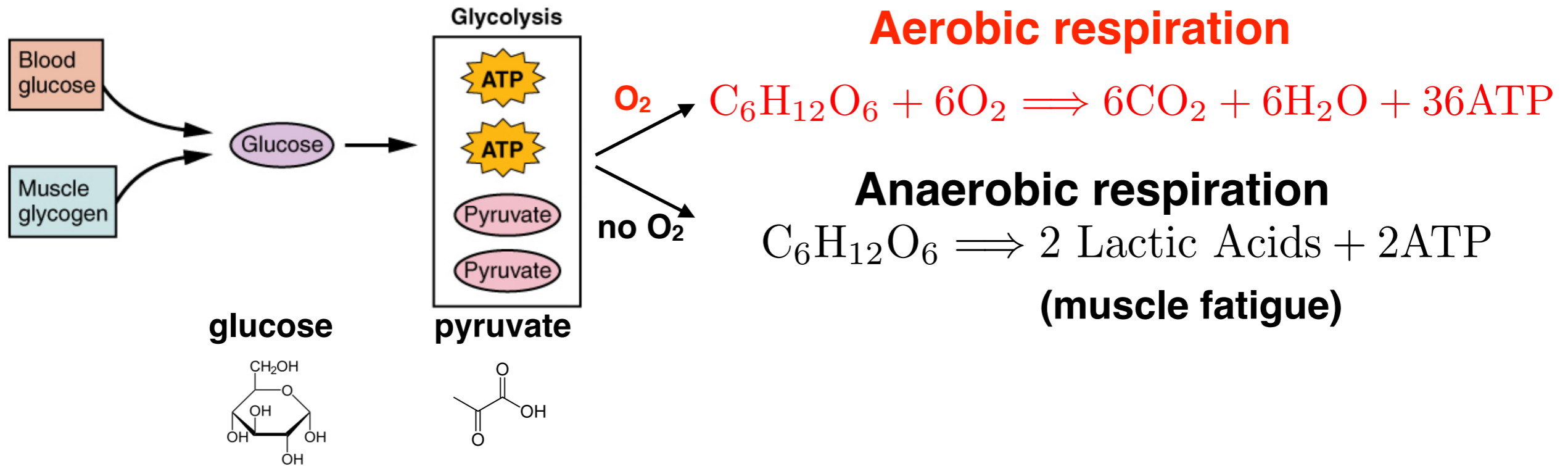
**glycogen**  
(polysaccharide of glucose)



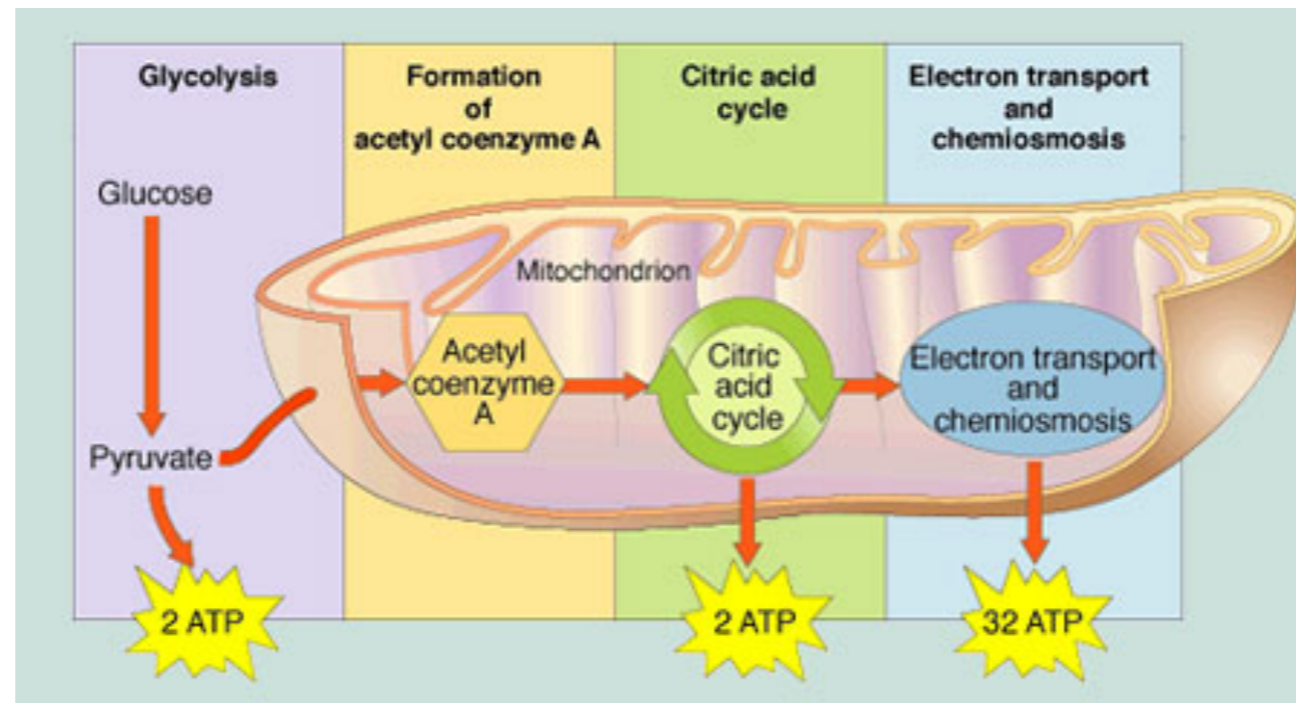
**glucose**  
(blood sugar)



# How muscles get ATP energy?



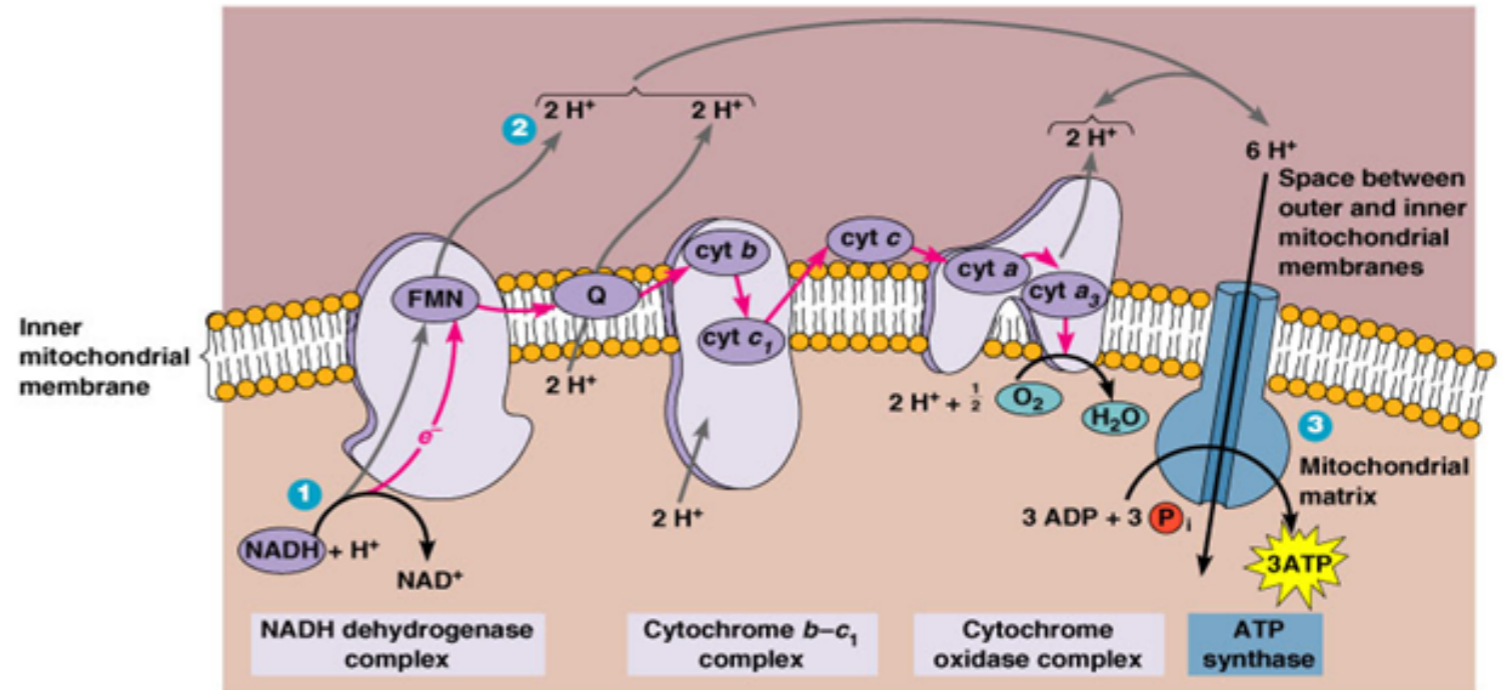
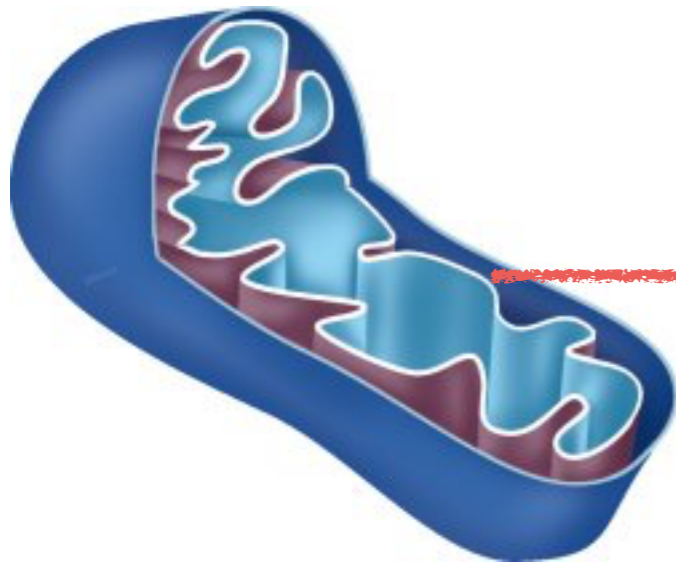
## Aerobic respiration



**Note:**  
**Citric acid cycle**  
**= Krebs cycle**

# Electron transport chain

## Mitochondrion



NADH products of the Cytric acid cycle are used to pump  $H^+$  to the space between outer and inner mitochondrial membrane.

Gradient of  $H^+$  concentration drives the ATP synthase motor that converts ADP to ATP.

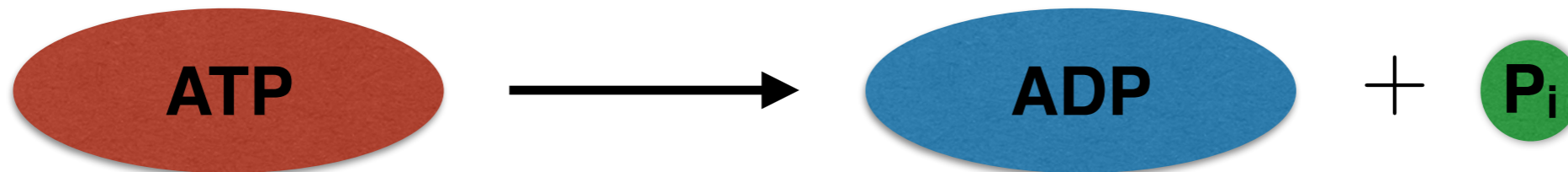
Note: ATP synthase can run in reverse and use ATP to pump  $H^+$  at low concentrations.

## ATP synthase



# Energetics of ATP hydrolysis

How much energy is released during ATP hydrolysis?



$$\Delta G = \mu_{\text{ADP}} + \mu_{\text{P}} - \mu_{\text{ATP}}$$



$$\Delta G = \mu_{\text{ADP}}^0 + \mu_{\text{P}}^0 - \mu_{\text{ATP}}^0 + k_B T \ln \left( \frac{[\text{ADP}][\text{P}_i]}{[\text{ATP}]c_0} \right)$$

$$-12.5k_B T$$

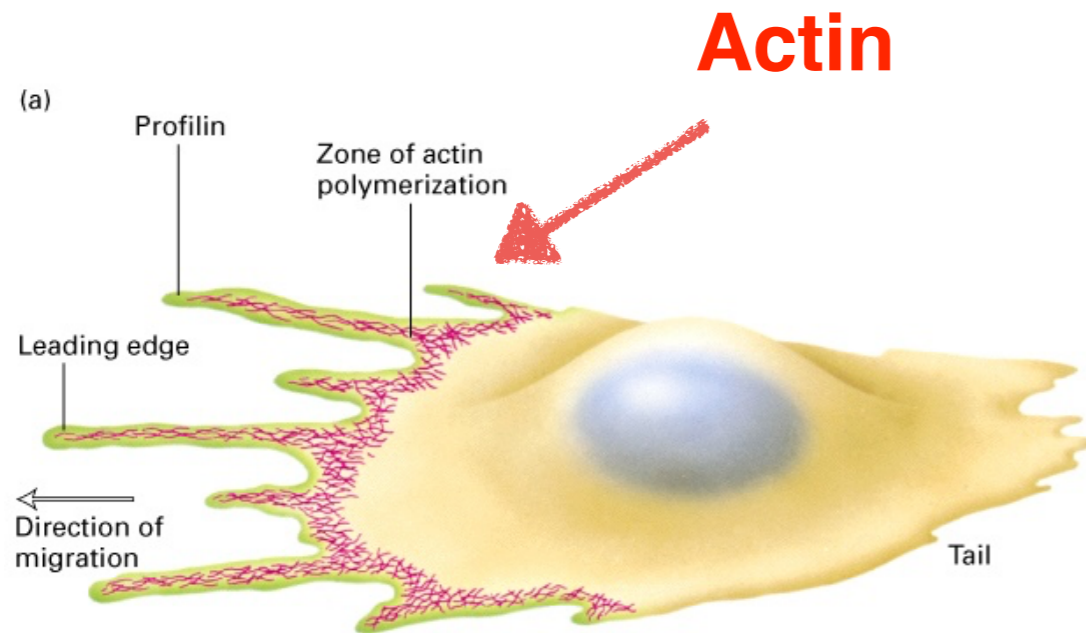
**Under physiological conditions:**  $\Delta G \sim -20k_B T$

$$([\text{ATP}], [\text{ADP}], [\text{P}_i] \sim 1\text{mM})$$

**Chemical potentials are typically defined relative to concentration  $c_0 \sim 1$  M.**

$$\mu_s(c_s) = \mu_s(c_0) + k_B T \ln(c_s/c_0)$$

# Crawling of cells



migration of skin cells during wound healing

spread of cancer cells during metastasis of tumors

amoeba searching for food

Immune system:  
neutrophils chasing bacteria

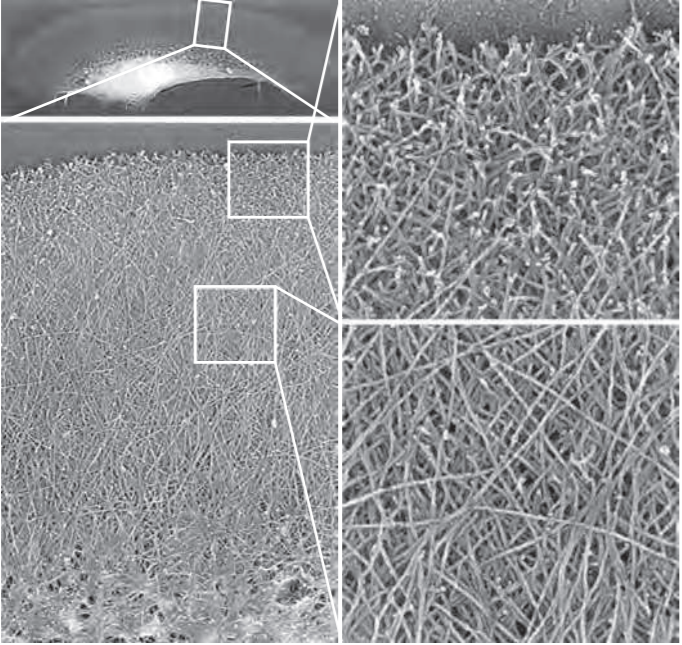
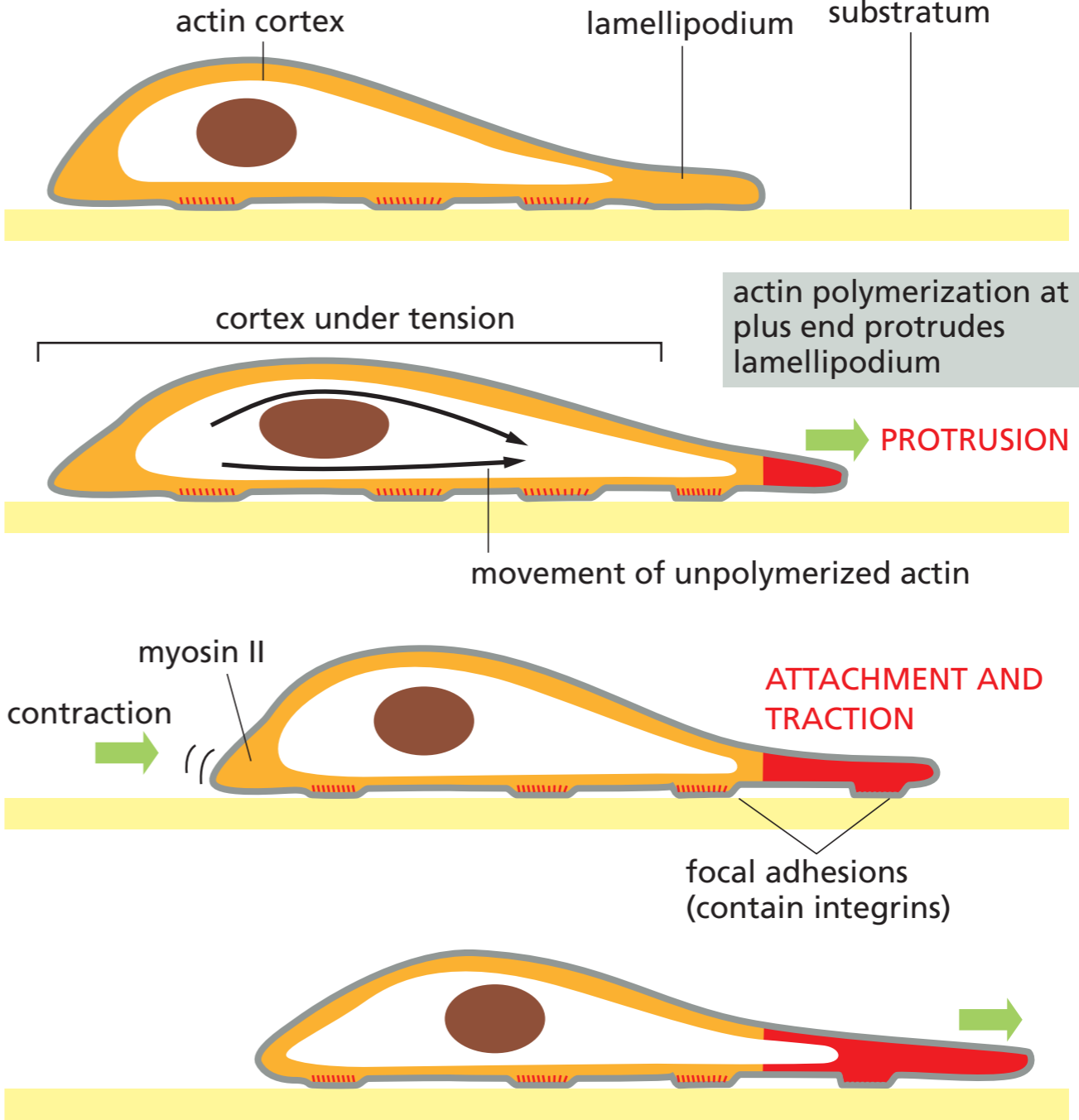


David Rogers, 1950s

$$v \sim 0.1 \mu\text{m/s}$$

# Crawling of cells

fish skin cell  $v = 0.2 \mu\text{m/s}$



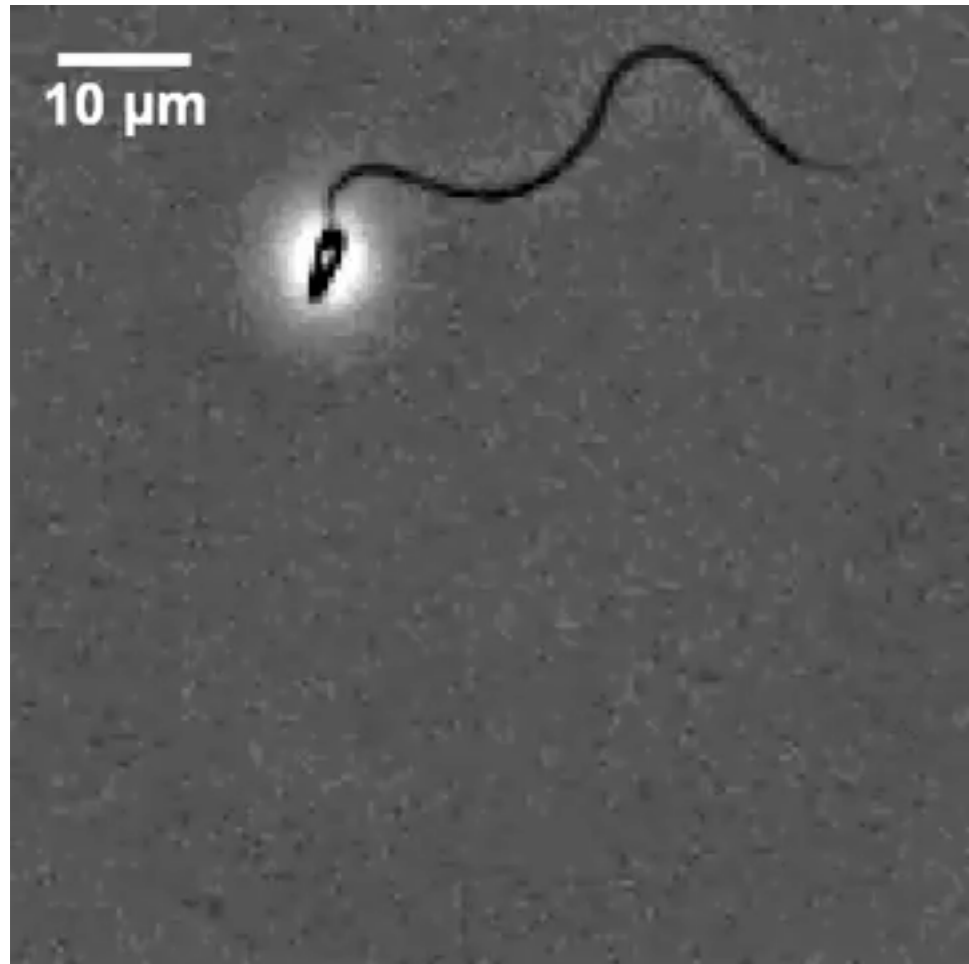
actin

R. Phillips et al., Physical Biology of the Cell

Alberts et al., Molecular Biology of the Cell

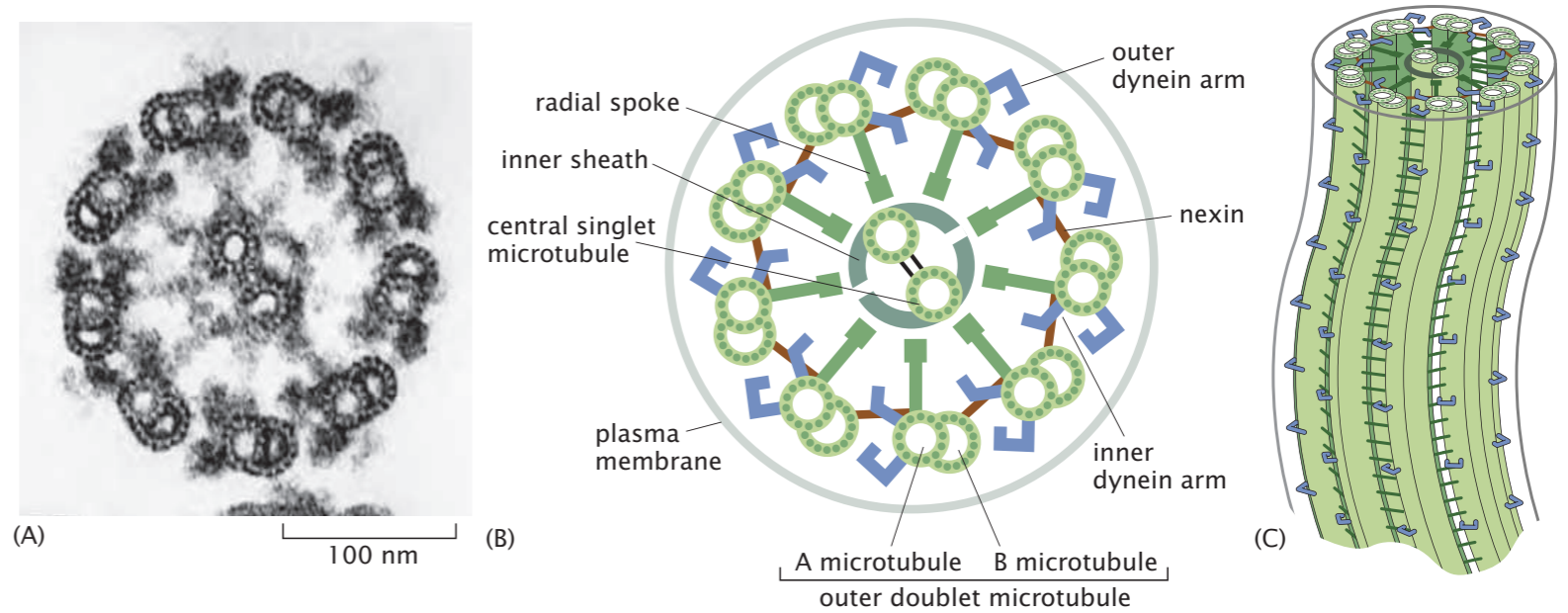
# Swimming of sperm cells

Sperm flagellum is constructed from microtubules

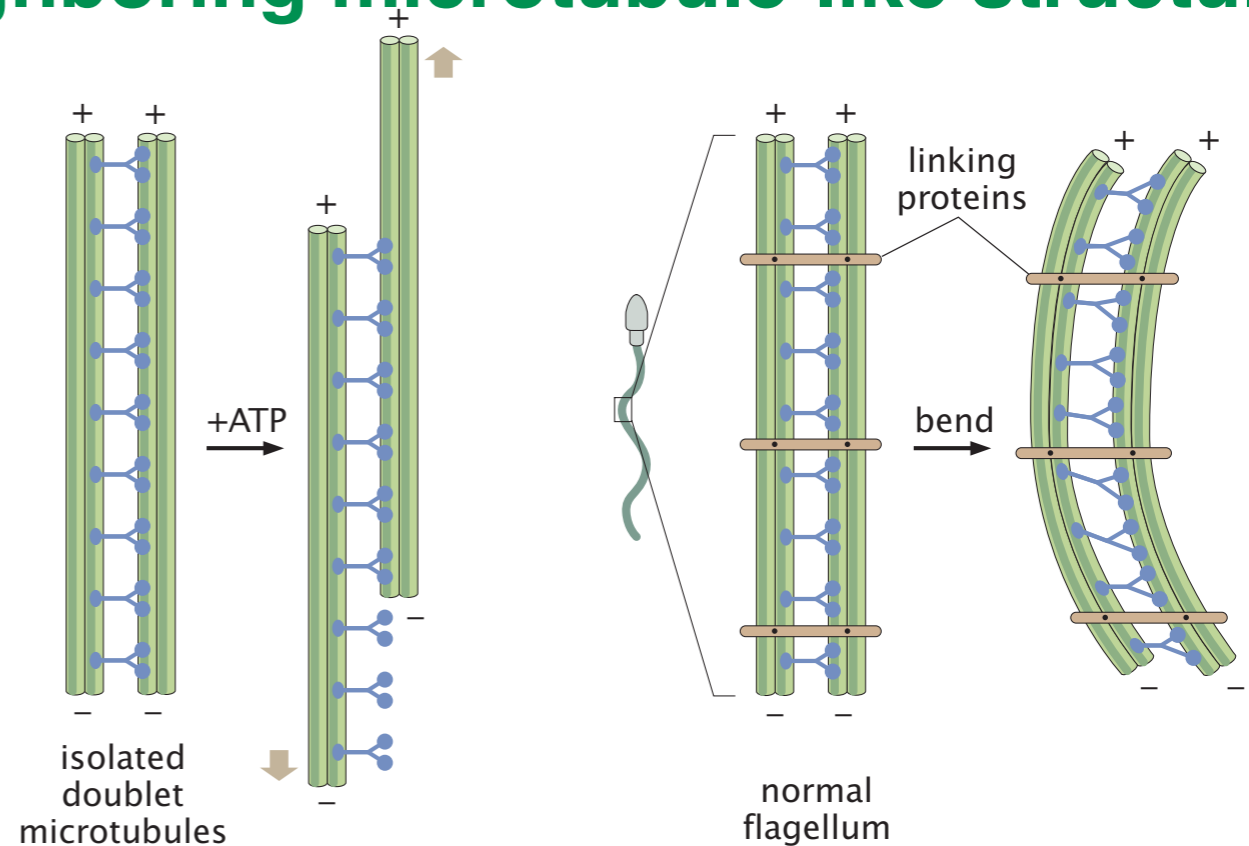


Jeff Guasto

$v \sim 50 \mu\text{m/s}$



Bending is produced by motors walking on neighboring microtubule-like structures



# Further reading

