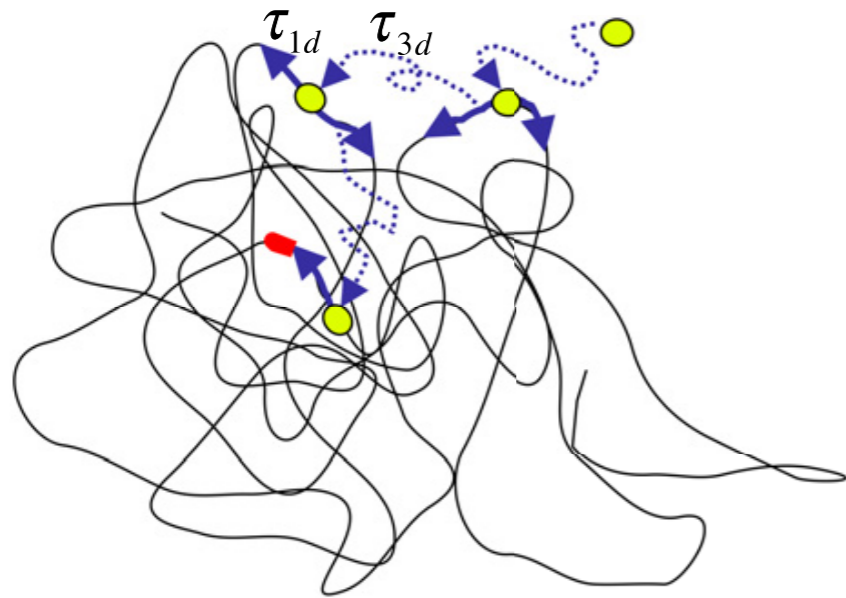


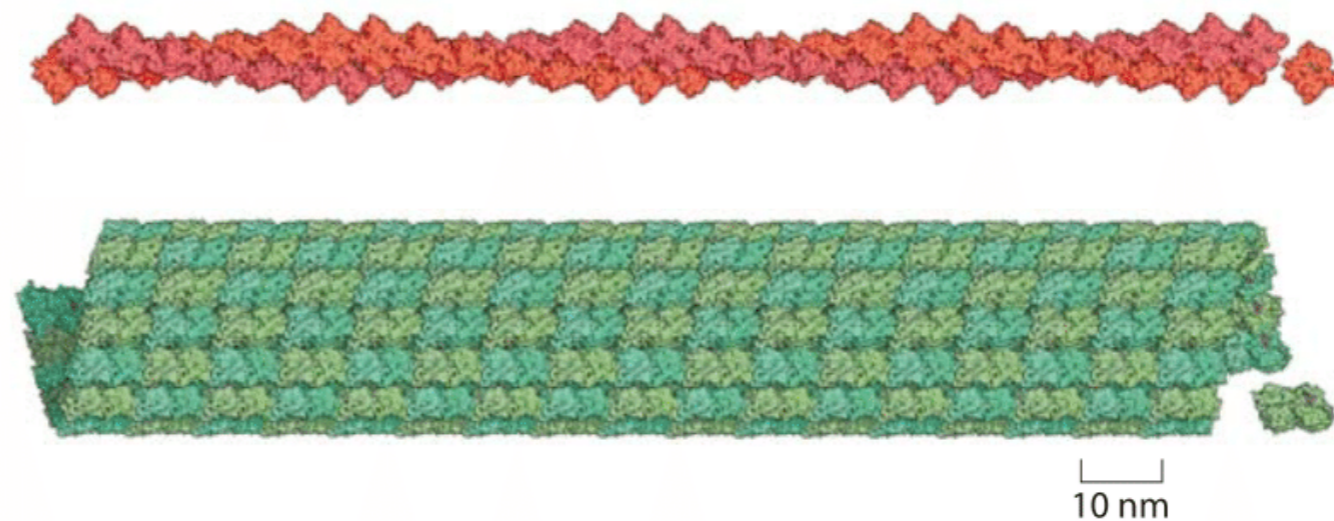
How proteins find target sites on DNA?



Statistical mechanics of polymers



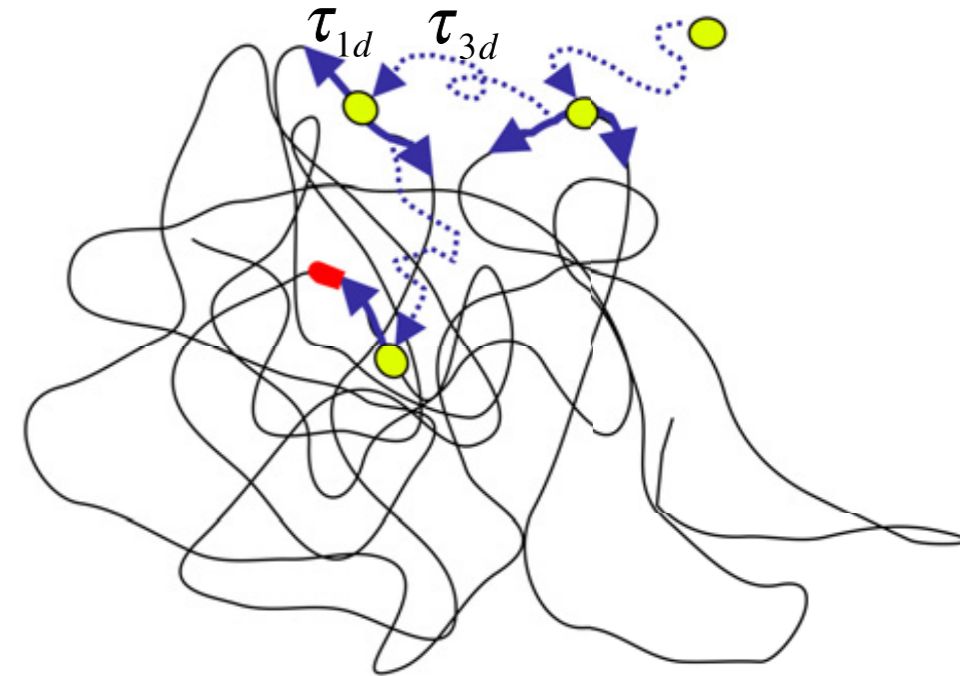
Growth dynamics of actin filaments and microtubules



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 τ_{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

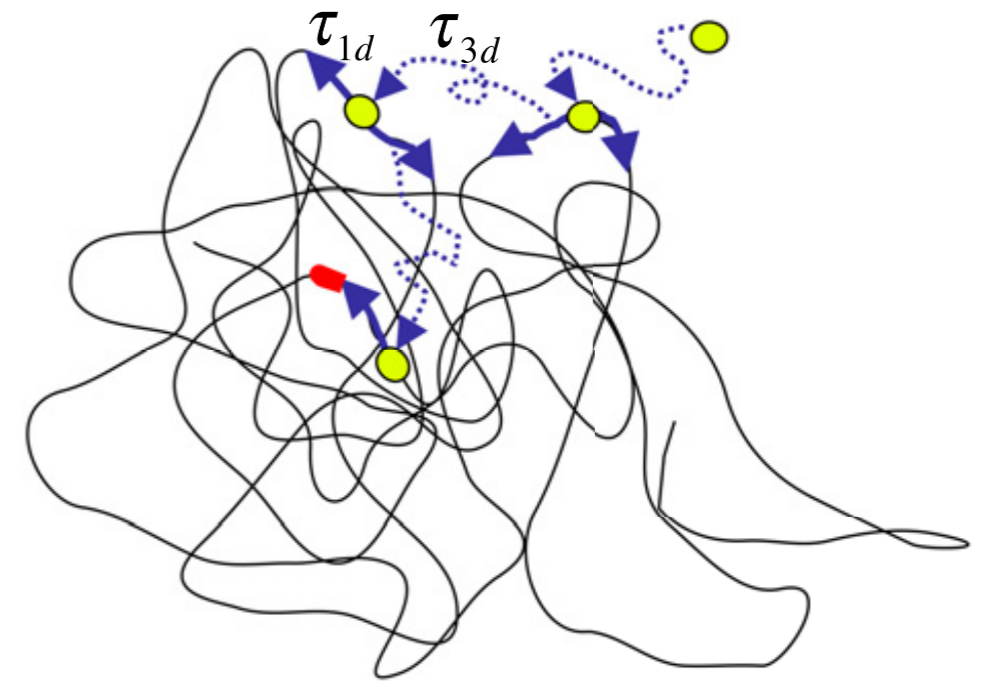
$$q = nb/L$$

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

τ_{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

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

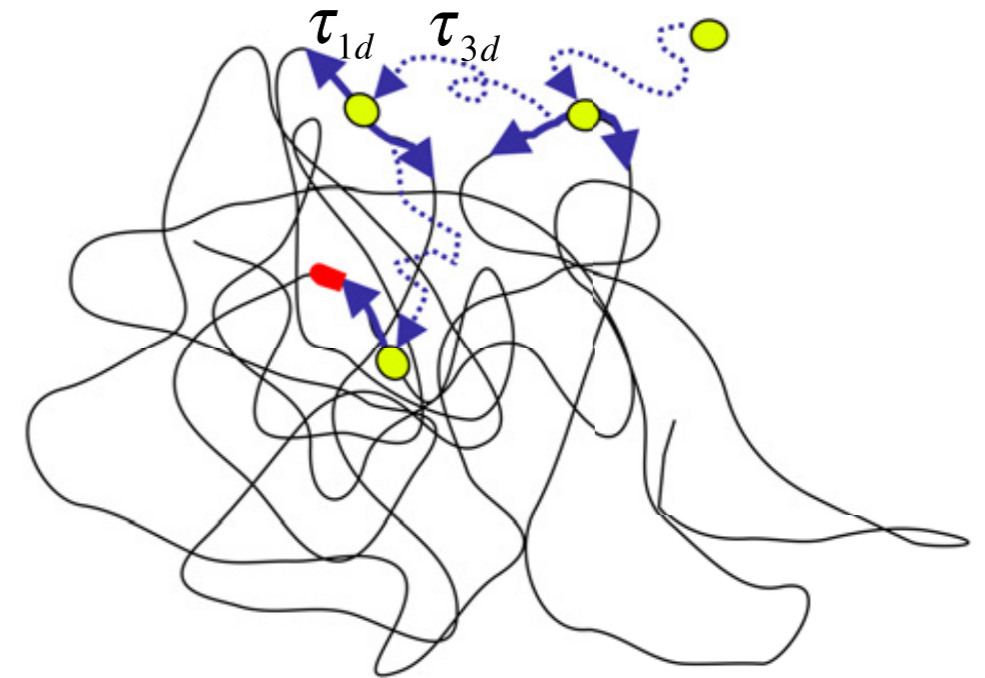
$$\langle n \rangle = 2\sqrt{D_1 \langle \tau_{1d} \rangle / (b^2)}$$

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

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

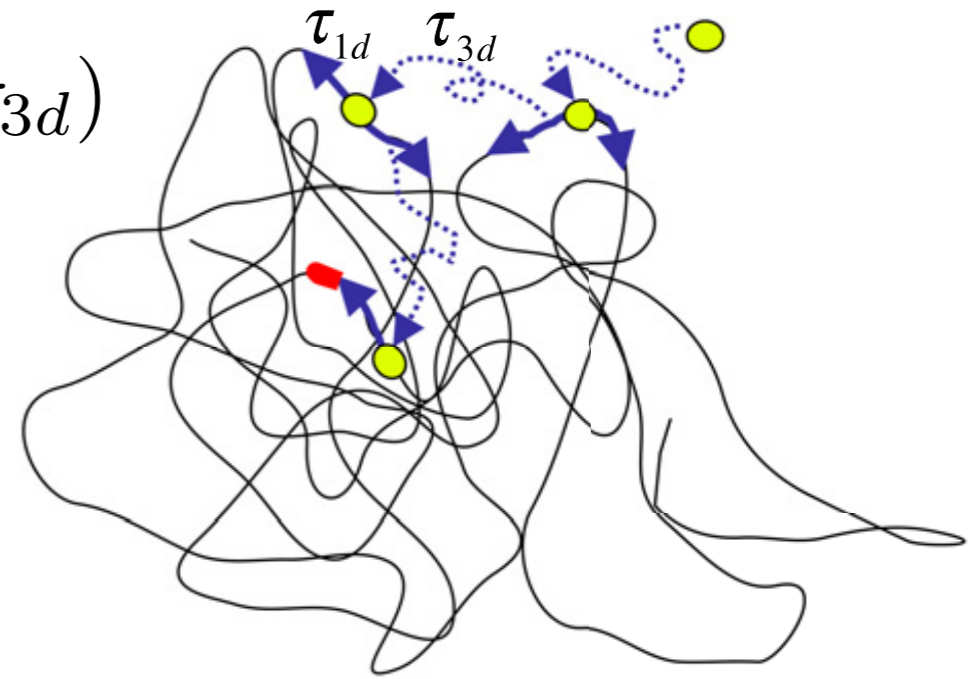
Optimal search time

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



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

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



$b = 0.34\text{nm}$ 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

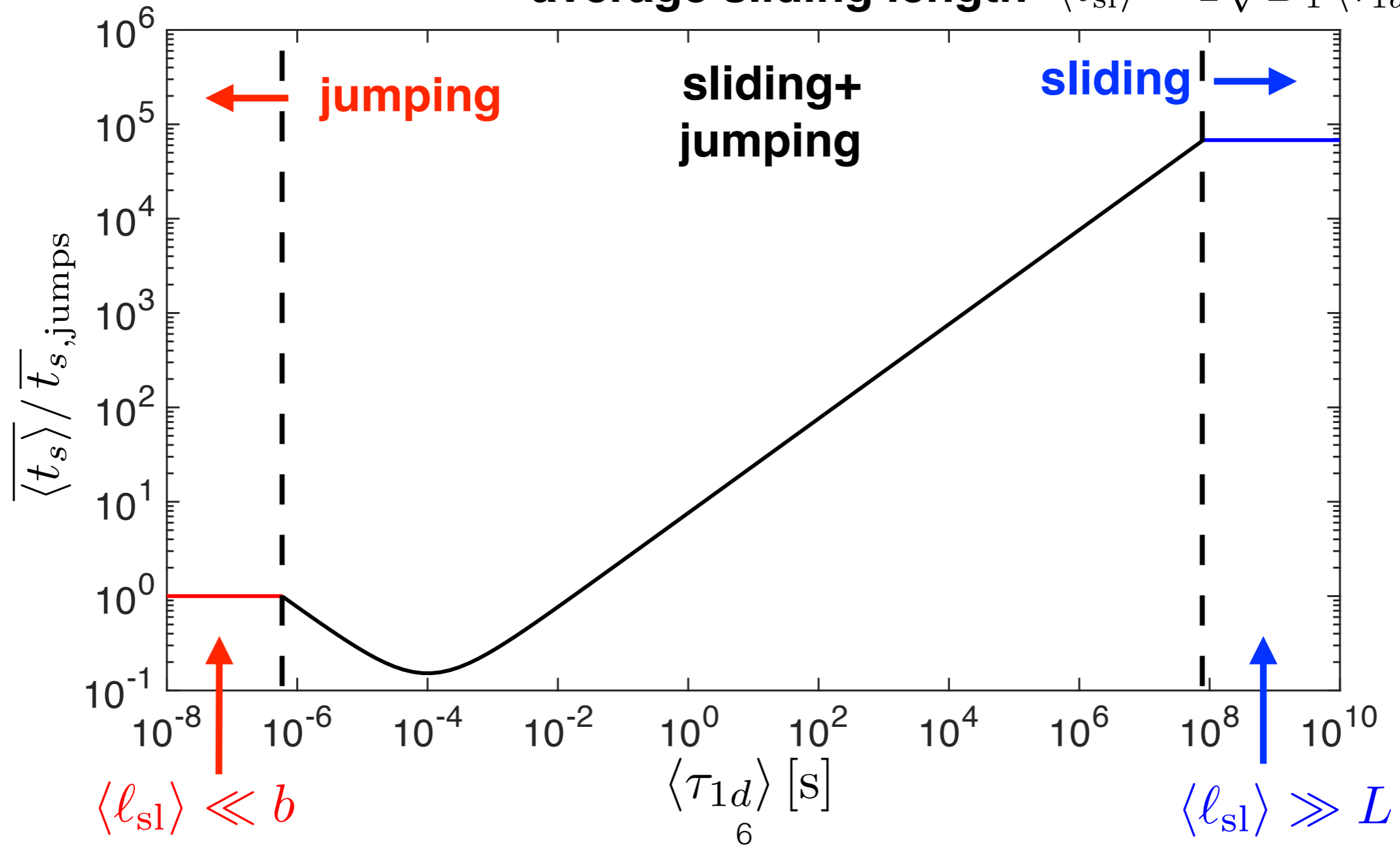
$$\overline{t_{s,\text{jumps}}} = (L/b)\tau_{3d} \approx 300 \text{ s}$$

average search time

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

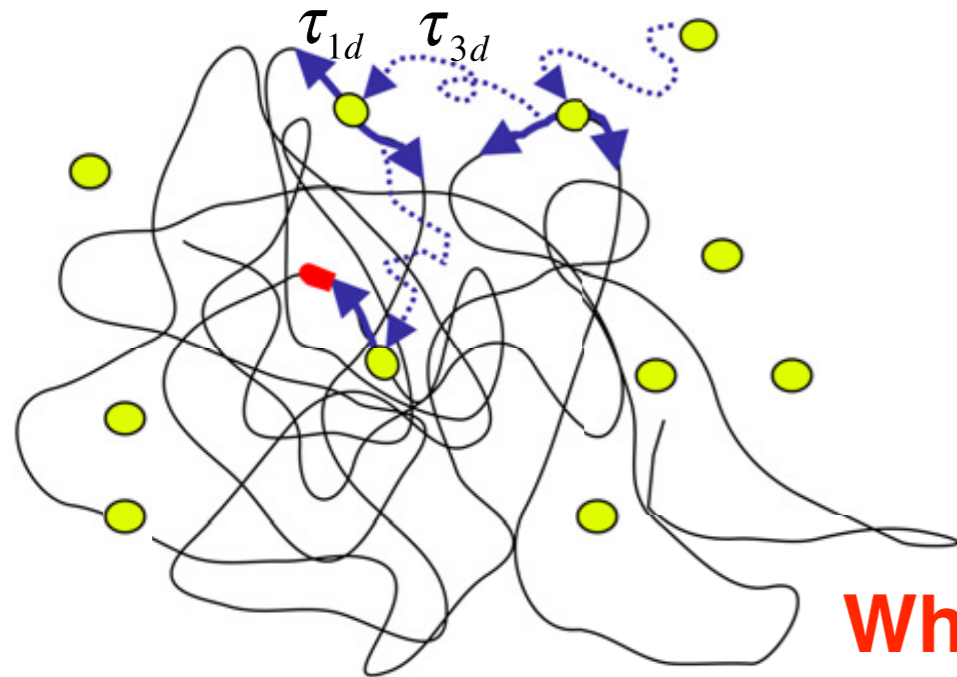
average sliding length

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



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)

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

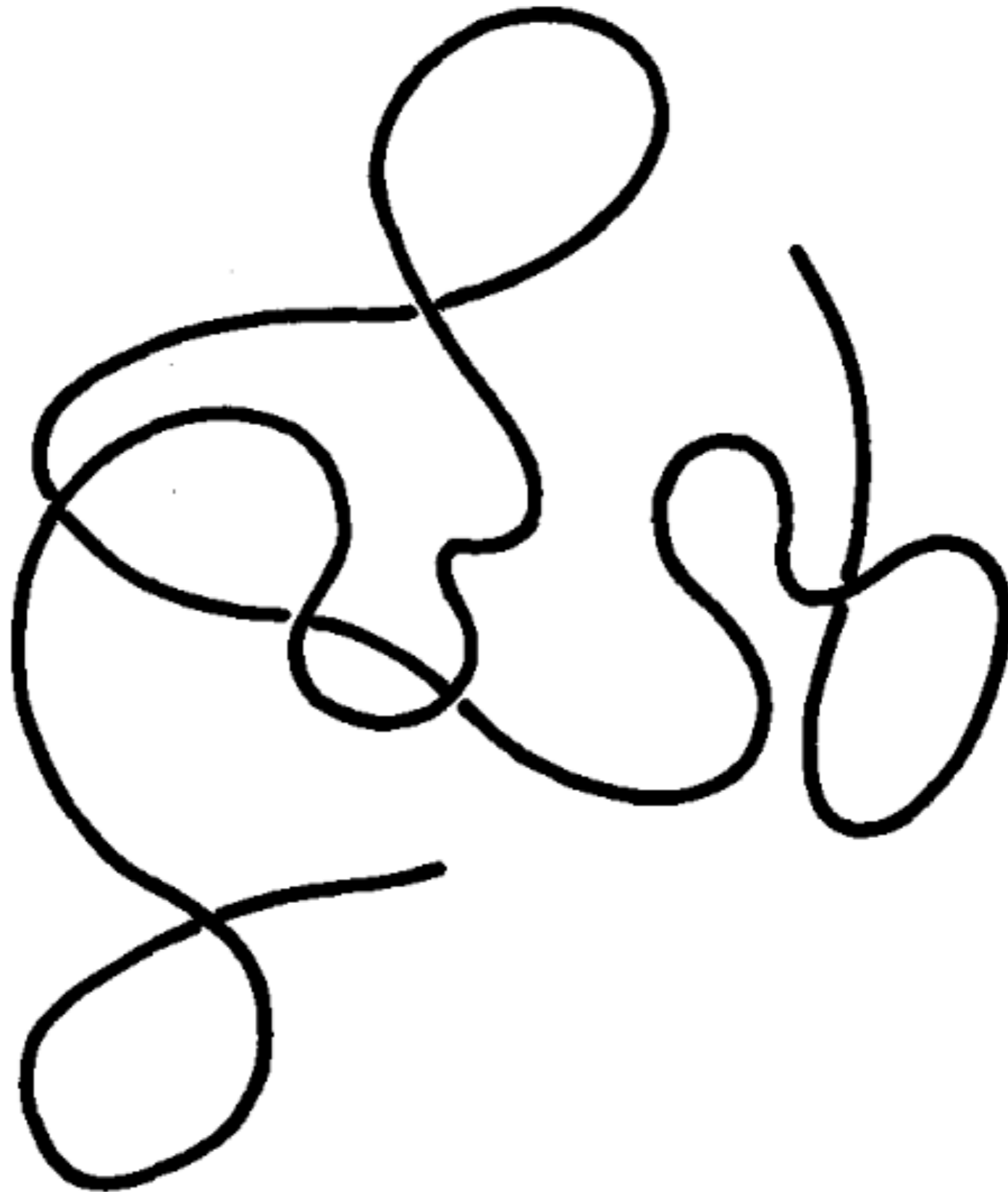
probability that one of n proteins finds the target site at time t_s

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: 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**

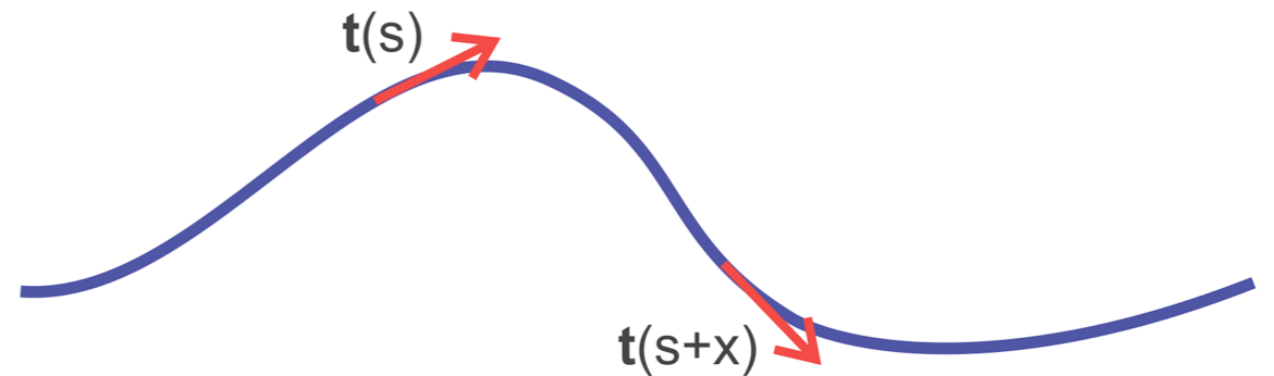
$$k_B = 1.38 \times 10^{-23} \text{ JK}^{-1}$$

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

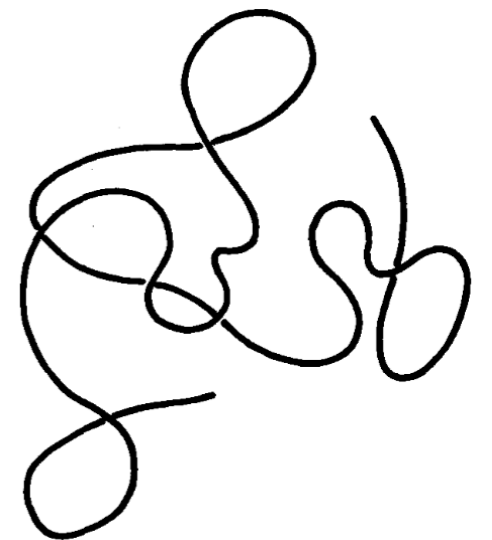
**Short filaments
remain straight**

$$L \ll \ell_p$$



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

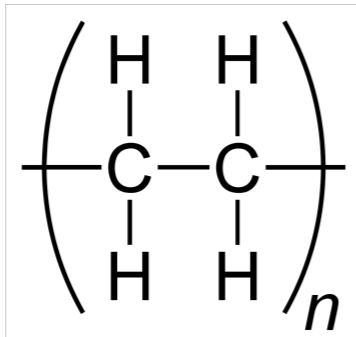
$$L \gg \ell_p$$



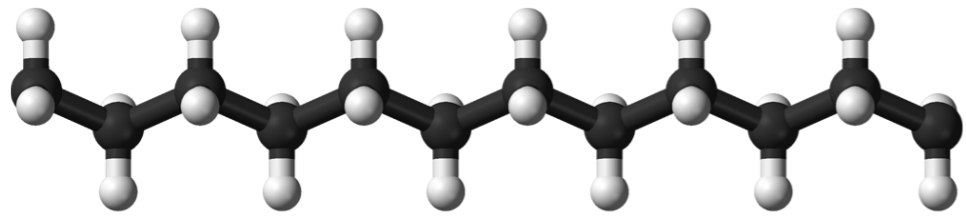
Examples: persistence length

polyethylene

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

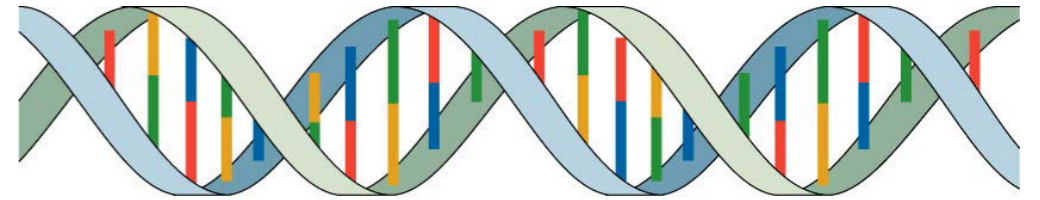


$$\ell_p = \frac{B}{k_B T}$$



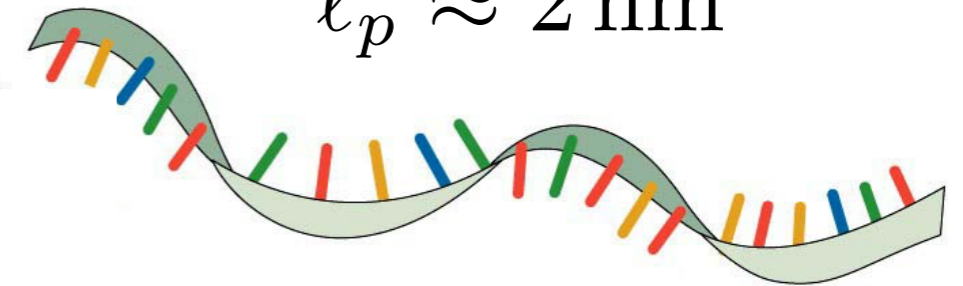
double stranded DNA

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



single stranded DNA

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



uncooked spaghetti

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



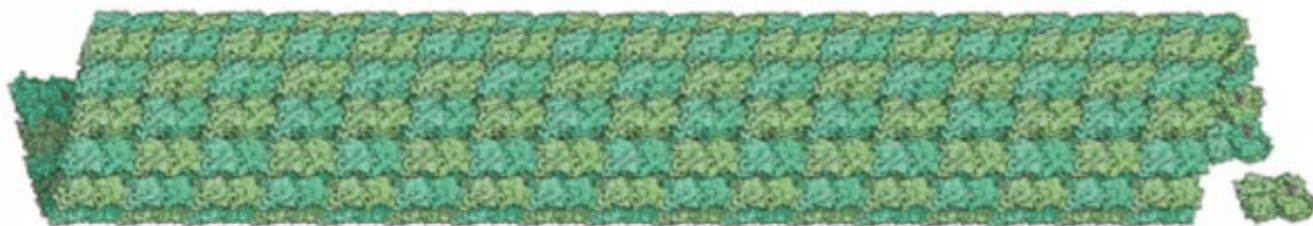
Persistence length for polymers is on the order of nm

actin

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



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



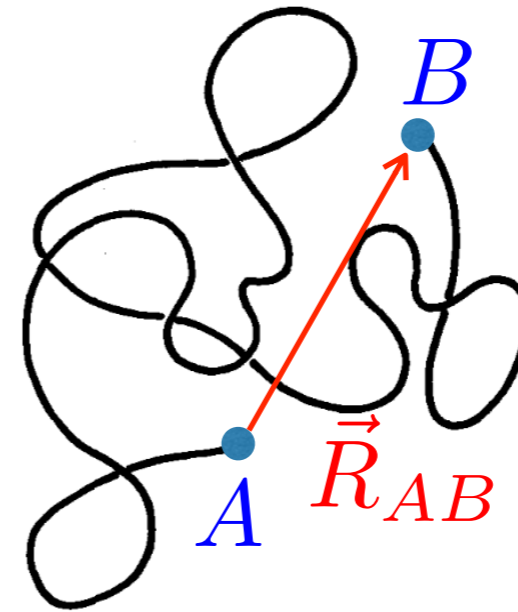
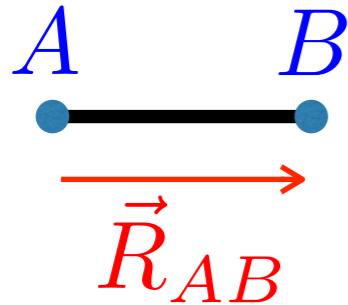
10 nm

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!

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

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

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

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

Exact result

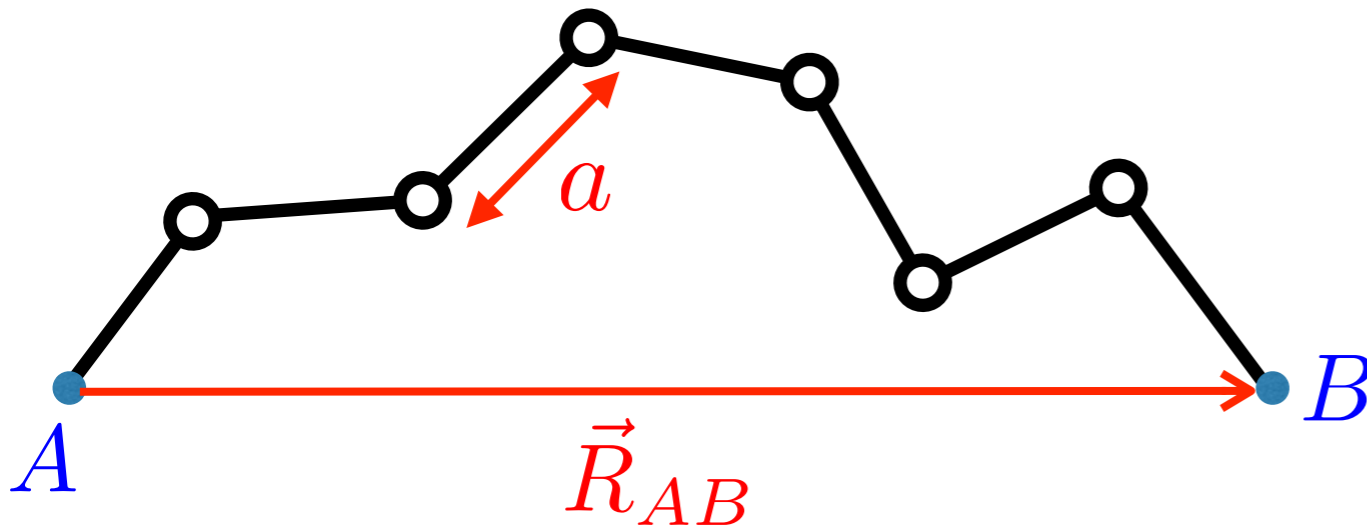
$$\langle \vec{R}_{AB}^2 \rangle = 2\ell_p L \left[1 - \frac{\ell_p}{L} \left(1 - e^{-L/\ell_p} \right) \right]$$

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.

$$E_c = 0$$

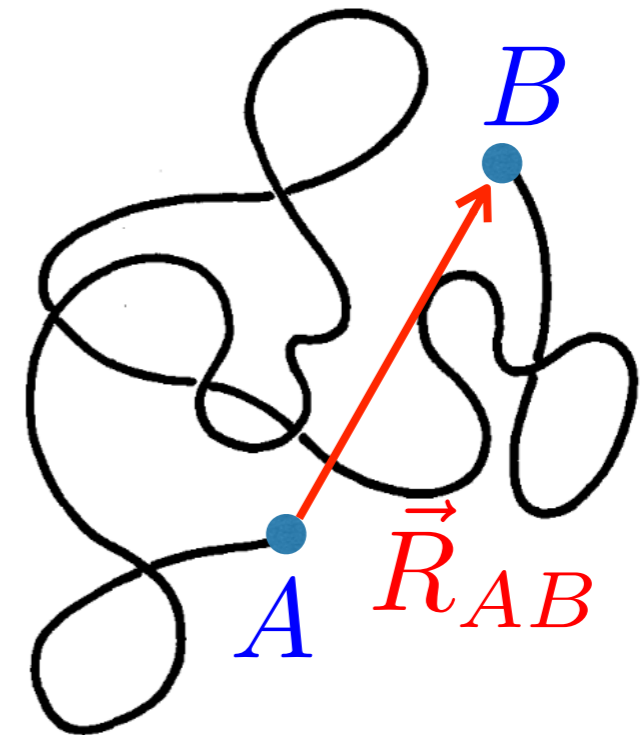
Each configuration C appears with probability

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

$L = Na$ - chain length

Worm-like chain

Continuous unstretchable rod



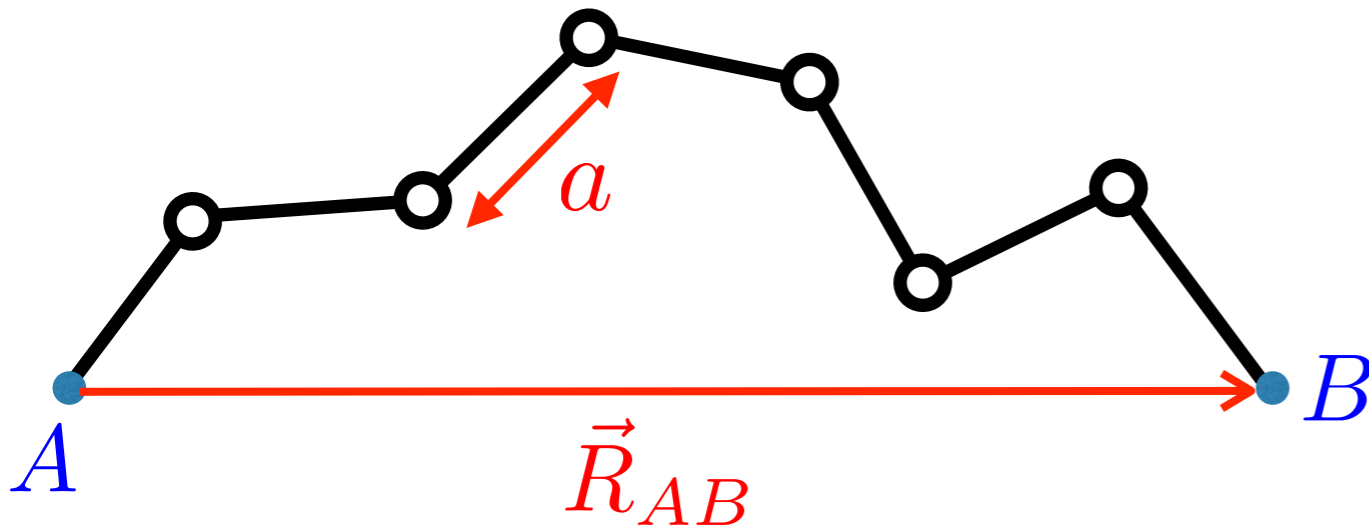
Bending energy cost of configuration C :

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

Ideal chain vs worm-like chain

Ideal chain

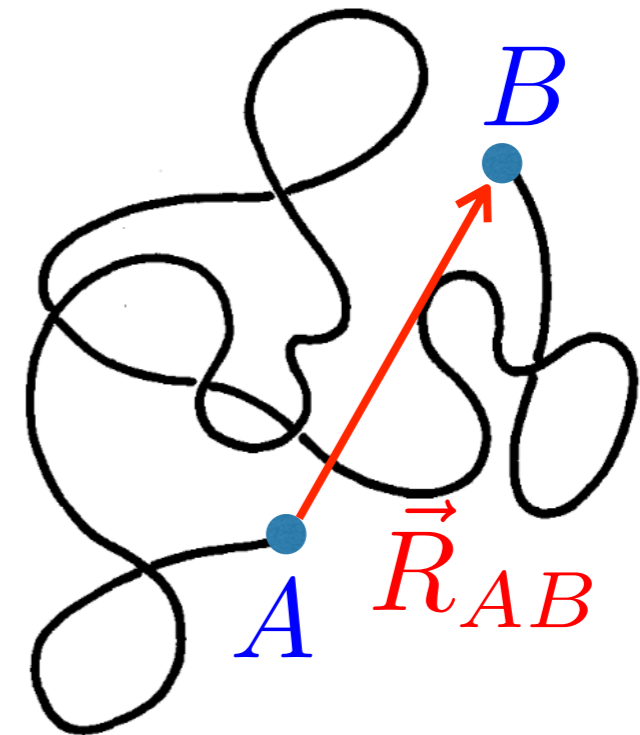
N identical unstretchable links (Kuhn segments) of length a with freely rotating joints



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

Worm-like chain

Continuous unstretchable rod



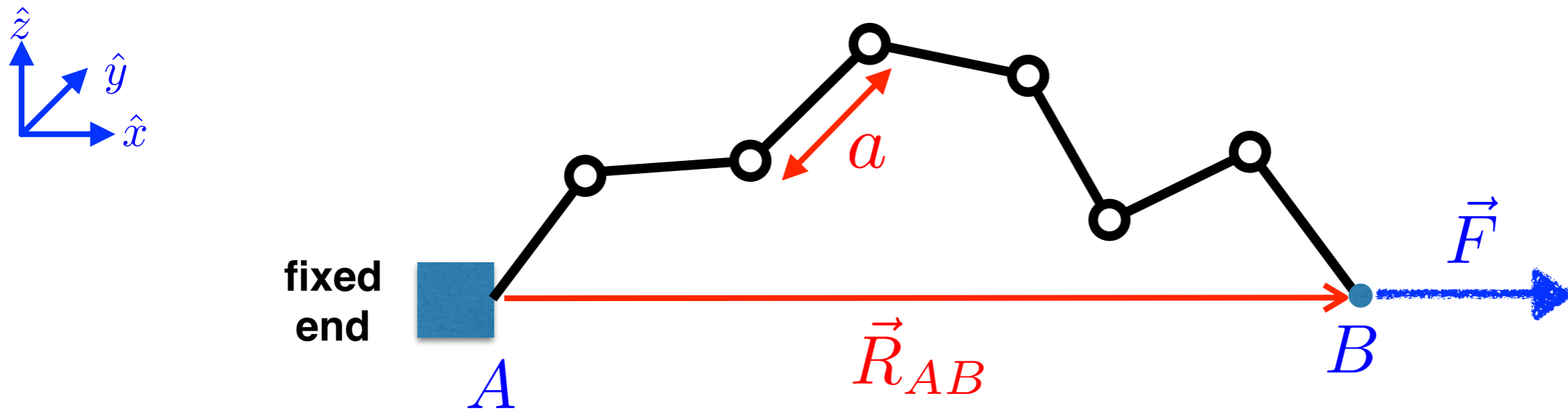
$$\langle \vec{R}_{AB}^2 \rangle \approx 2\ell_p L = \frac{2BL}{k_B T}$$

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

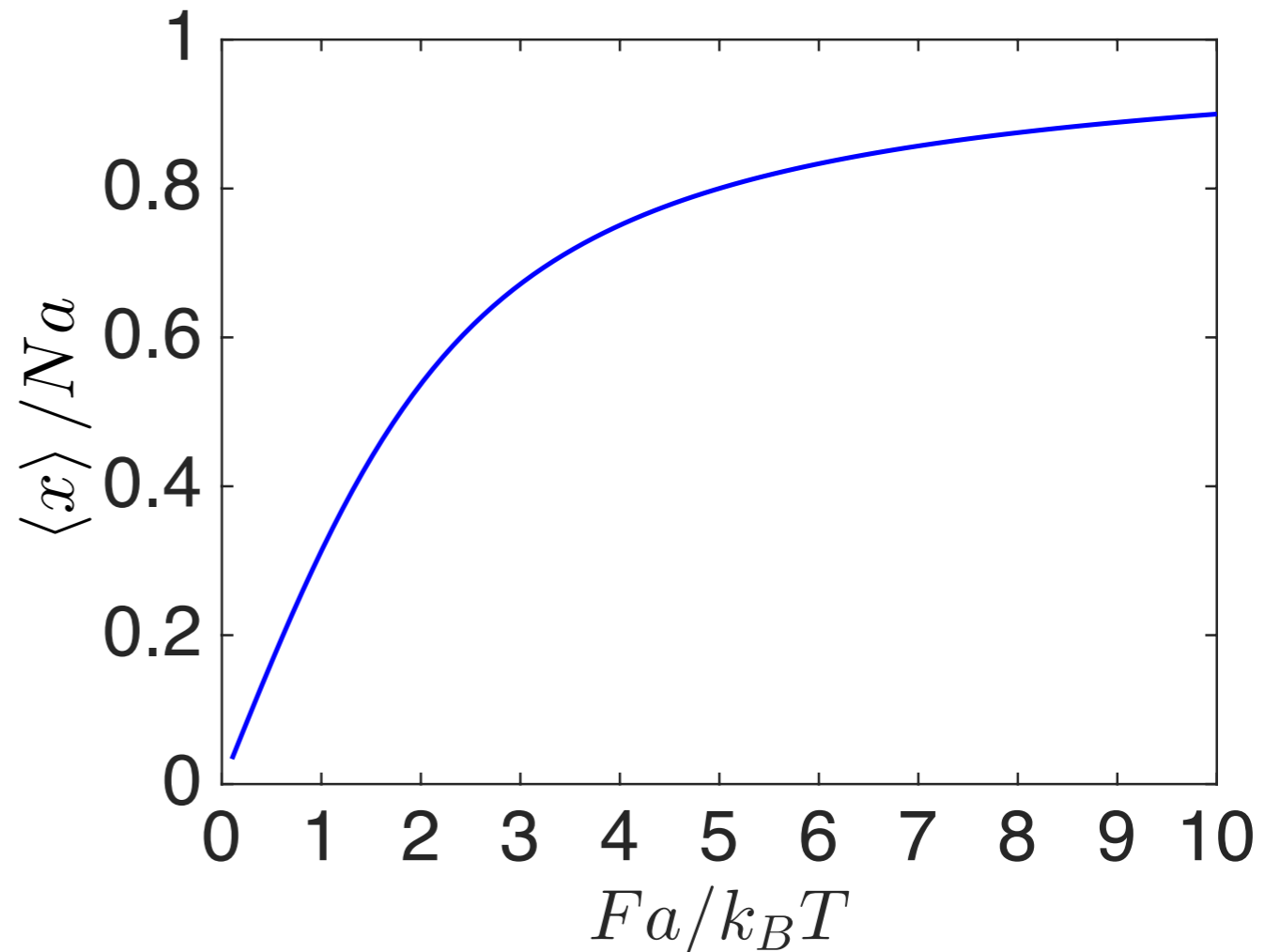
$$\langle x \rangle = Na \left(\coth \left[\frac{Fa}{k_B T} \right] - \frac{k_B T}{Fa} \right)$$

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 $Fa \gg k_B T$

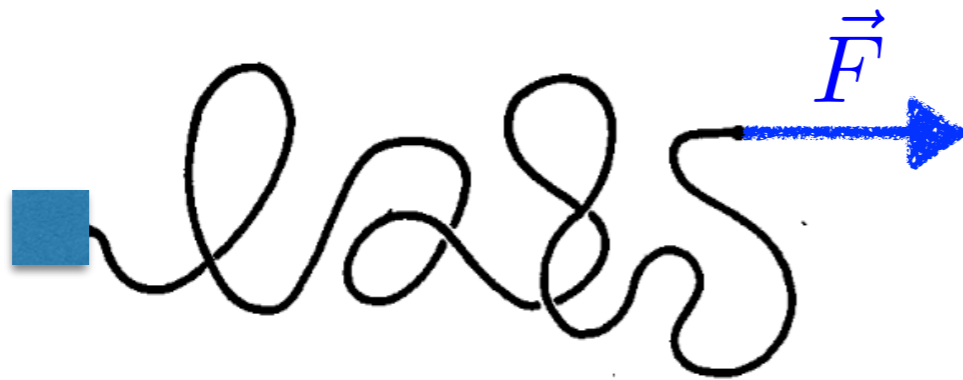
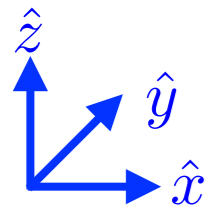
$$\langle x \rangle \approx Na \left(1 - \frac{k_B T}{Fa} \right) = L \left(1 - \frac{k_B T}{2F\ell_p} \right)$$



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

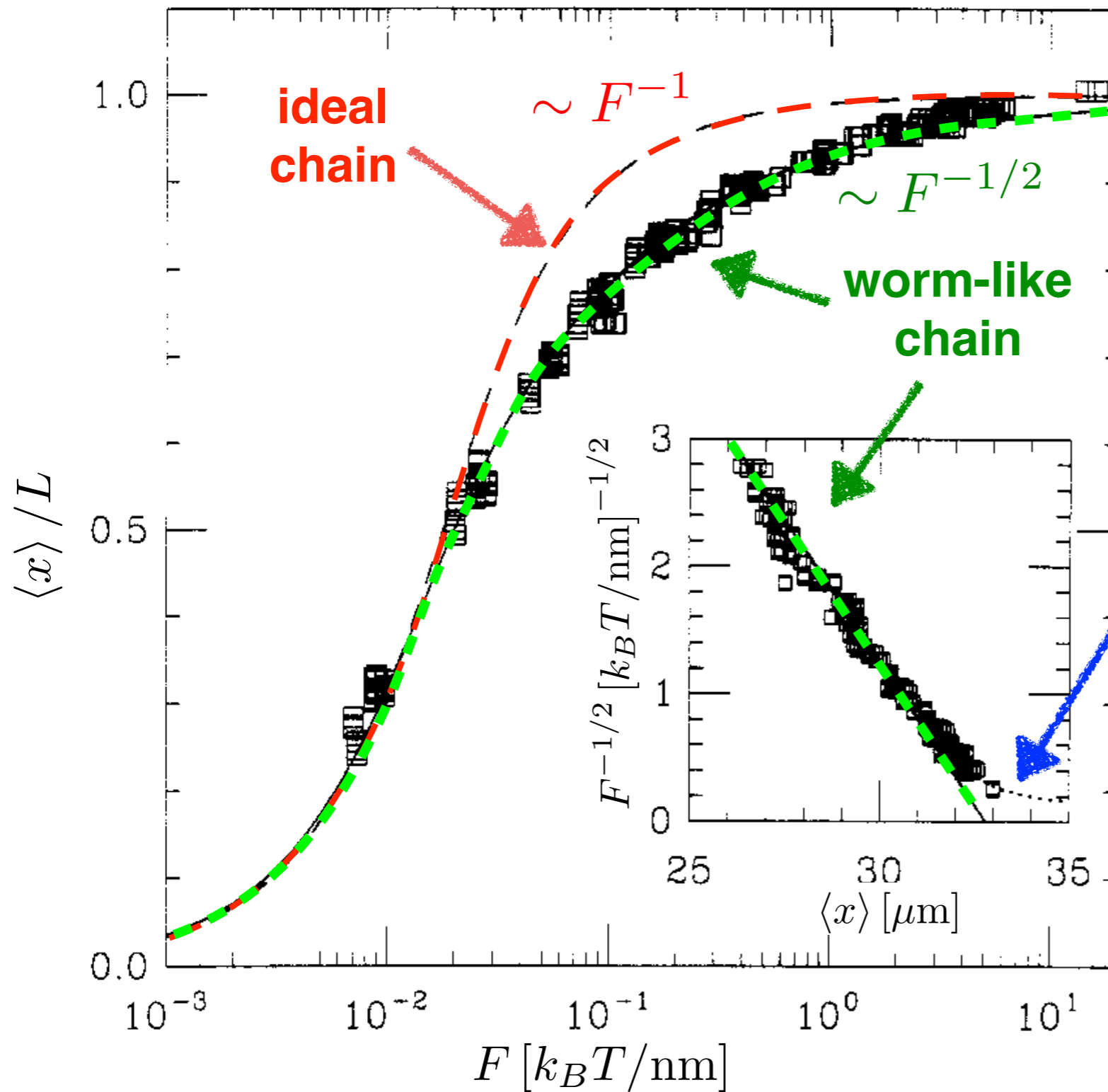
Approximate expression that interpolates between both regimes

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

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

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

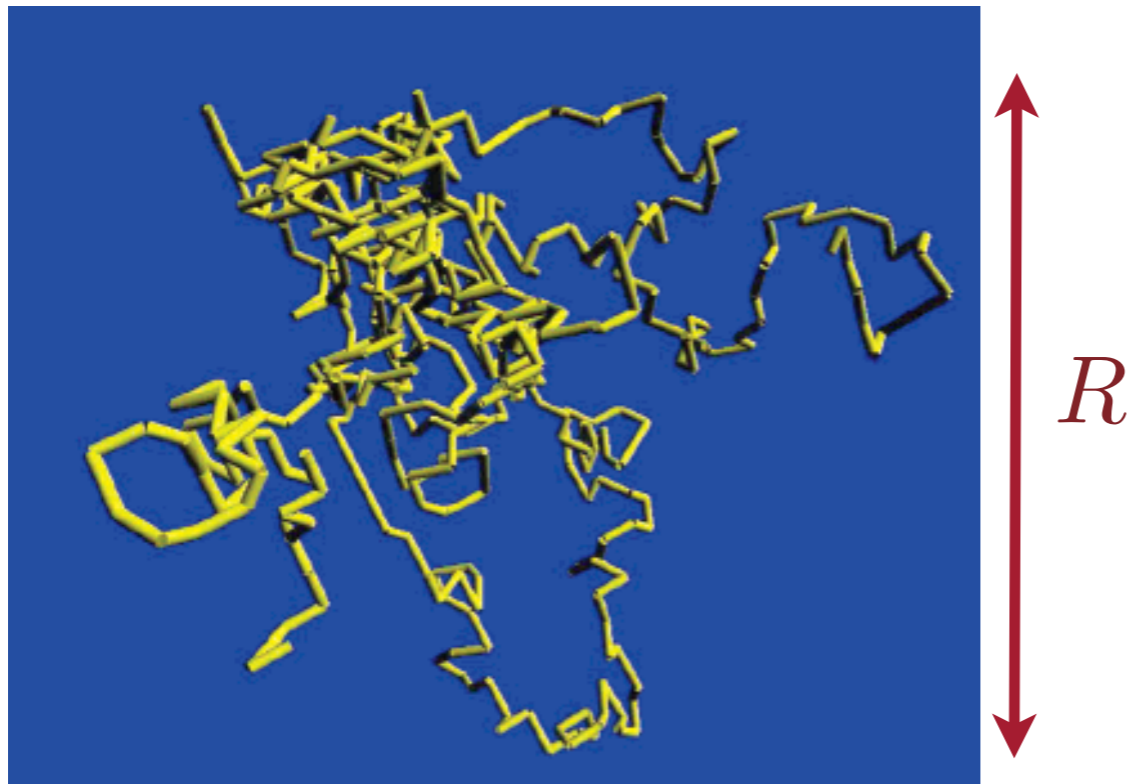
$$\frac{F \ell_p}{k_B T} = \frac{1}{4} \left(1 - \frac{\langle x \rangle}{L} + \frac{F}{\gamma} \right)^{-2} - \frac{1}{4} + \frac{\langle x \rangle}{L} - \frac{F}{\gamma}$$

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

Random coil to globule transition in polymers

random coil

$$T > \Theta$$

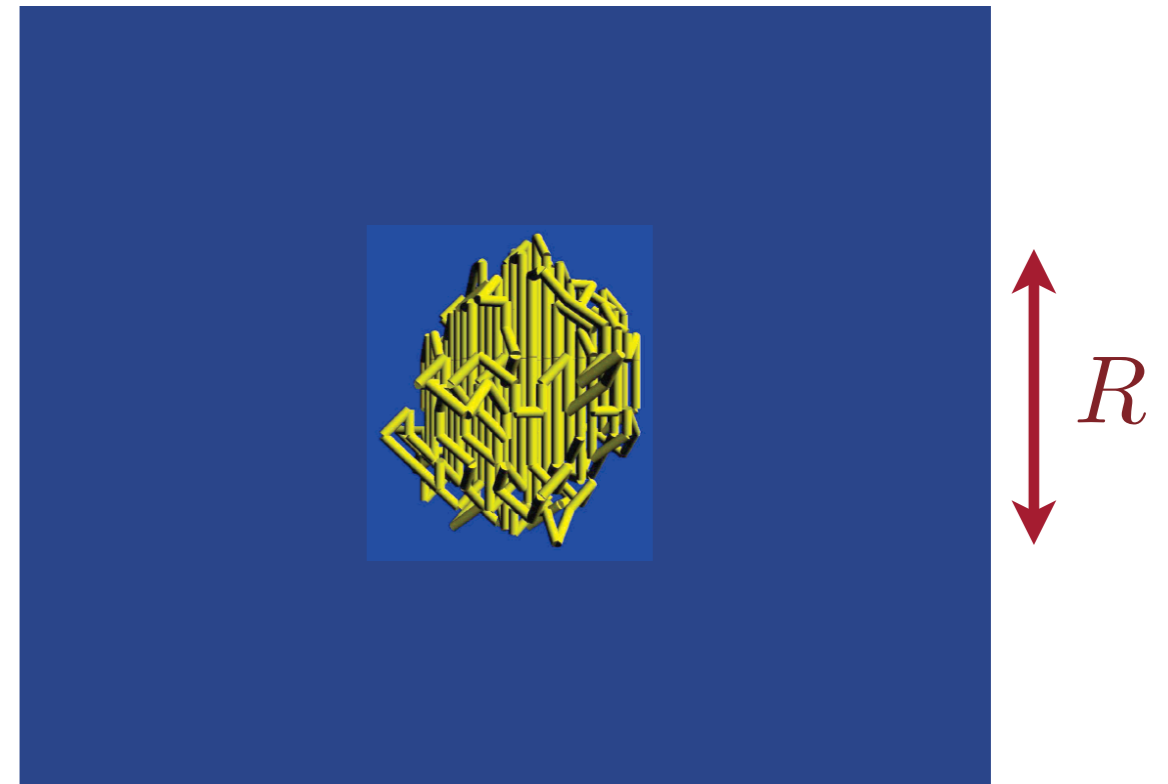


$$R \sim \sqrt{Ll_p}$$

**at high temperature
entropic contributions
dominate**

compact globule

$$T < \Theta$$

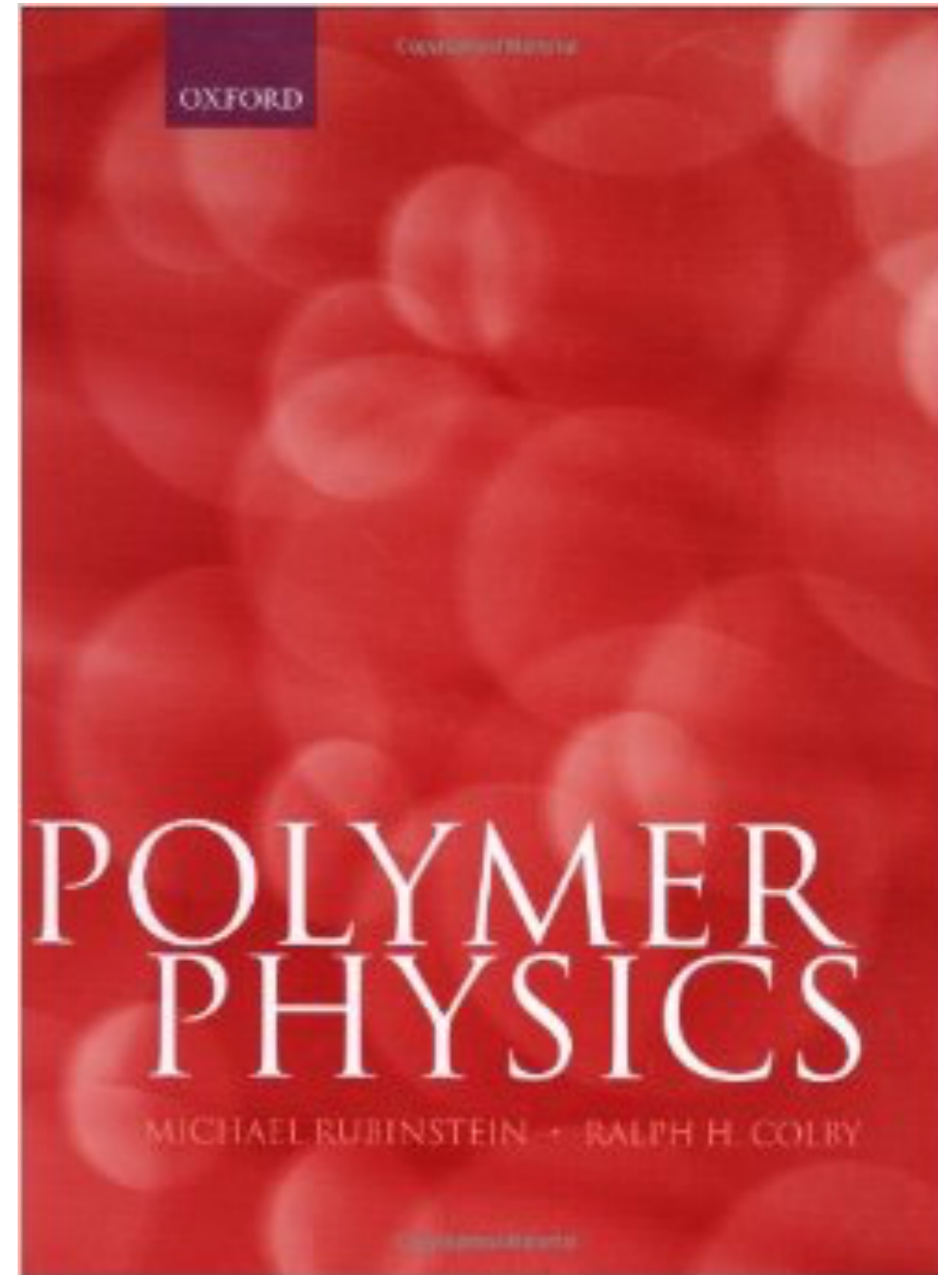
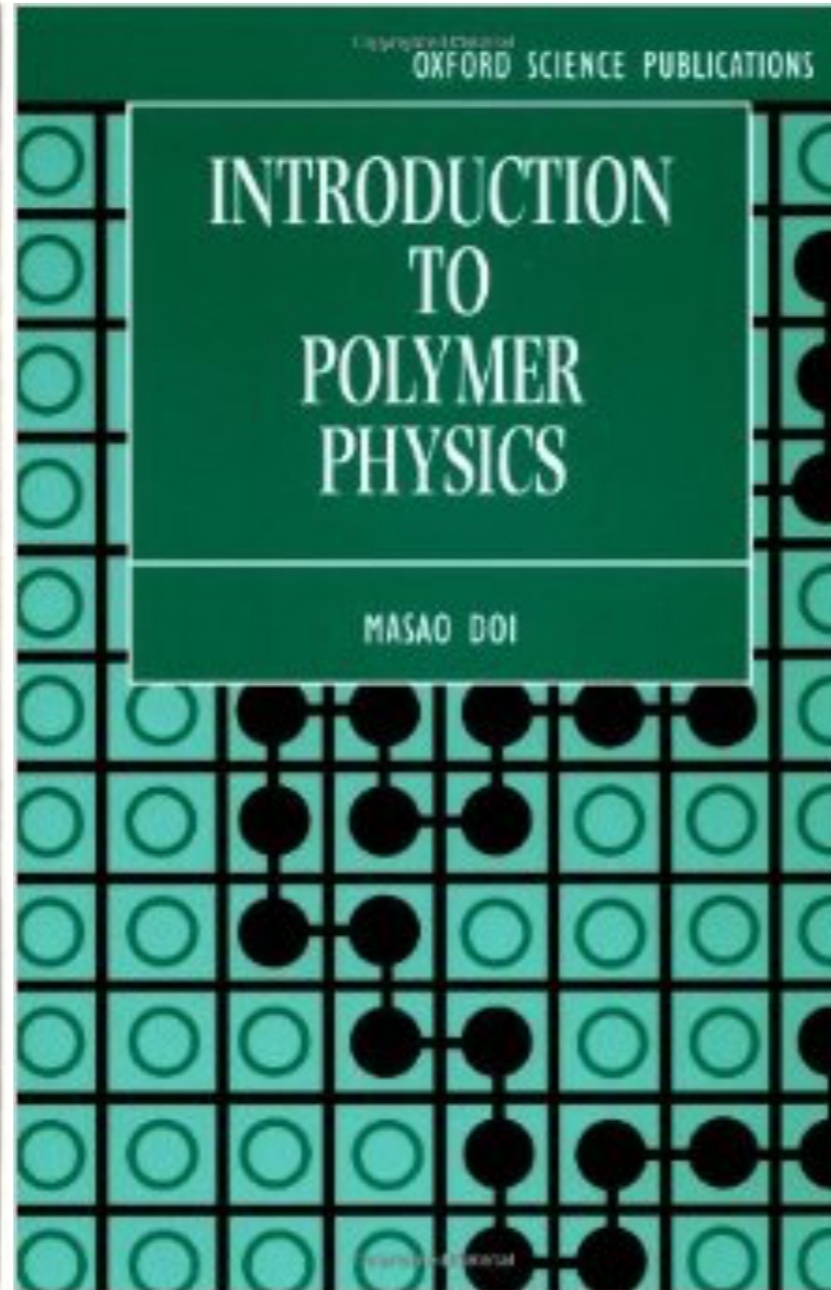
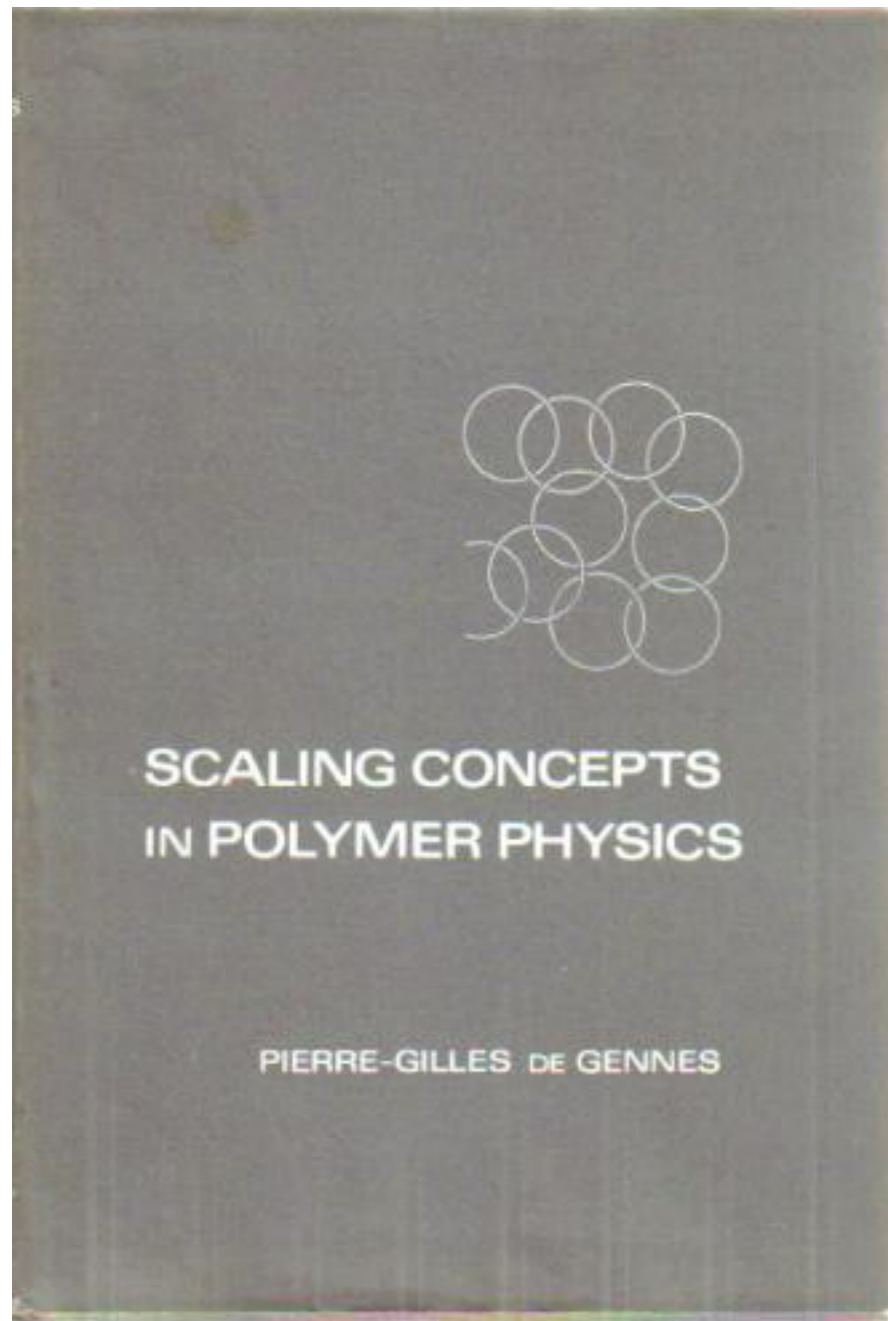


$$R \sim (d^2 L)^{1/3}$$

***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

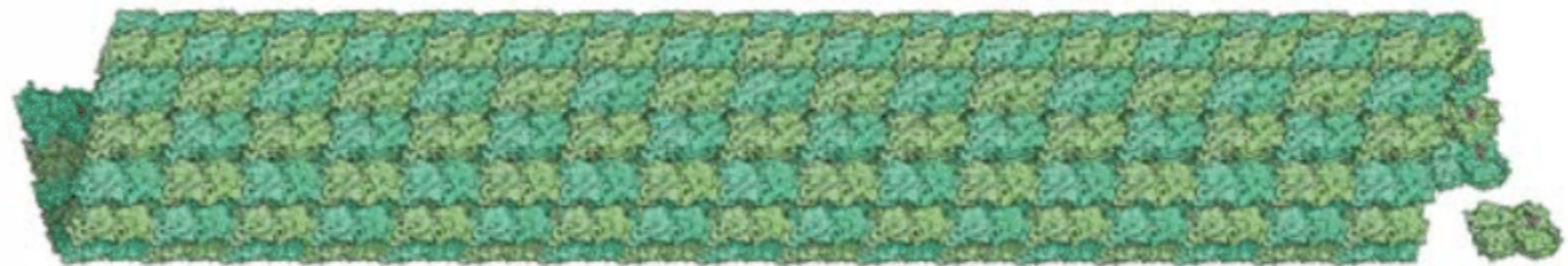


Dynamics of actin filaments and microtubules

Actin filament



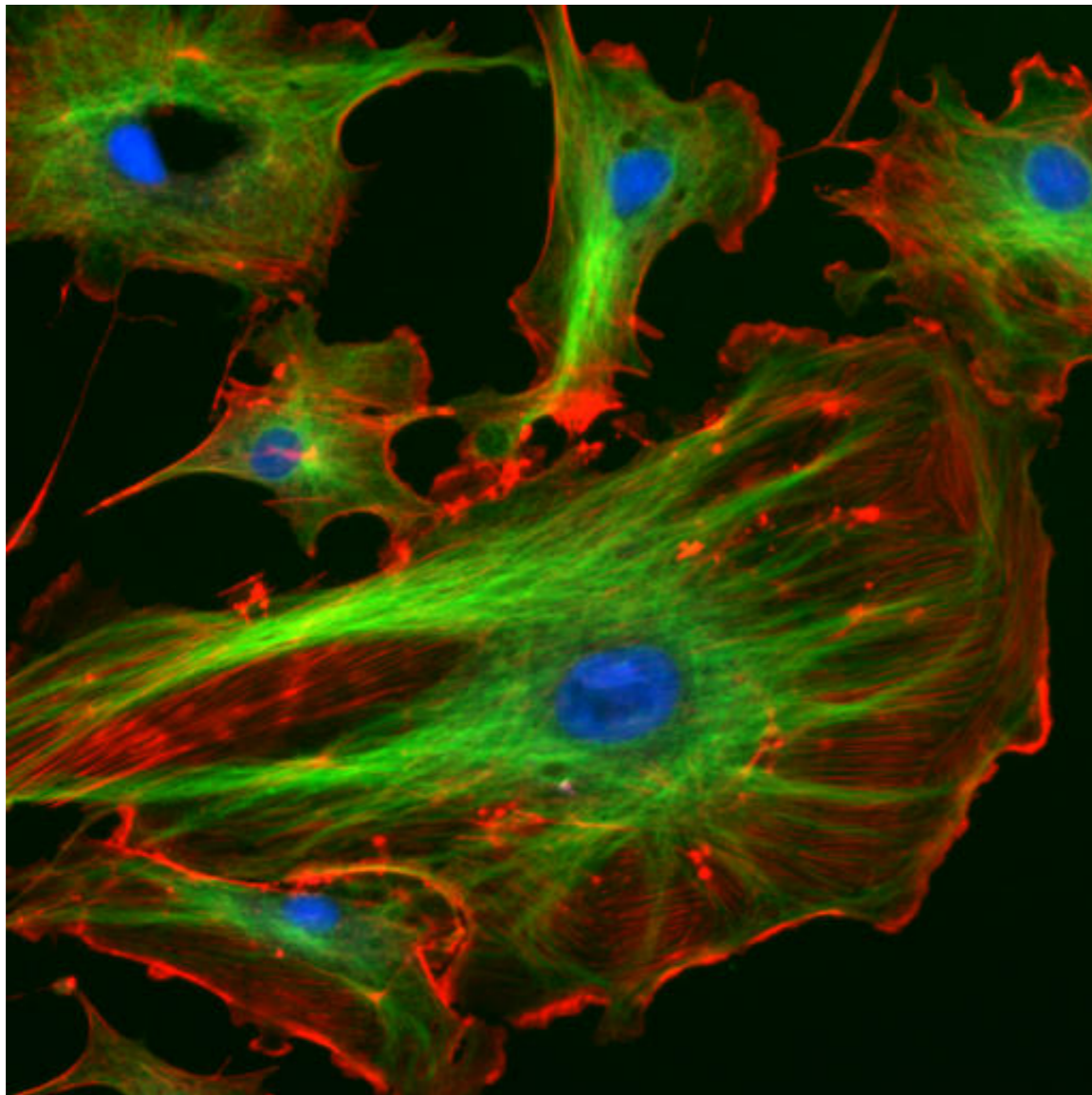
Microtubule



10 nm

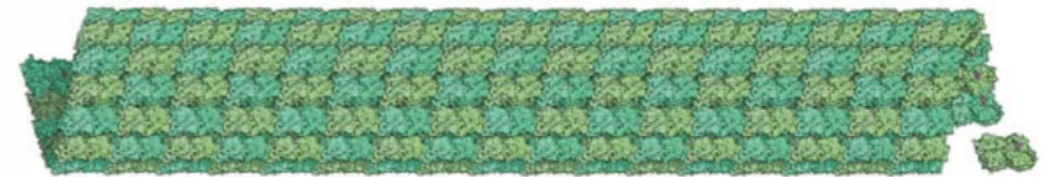
Cytoskeleton in cells

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



(wikipedia)

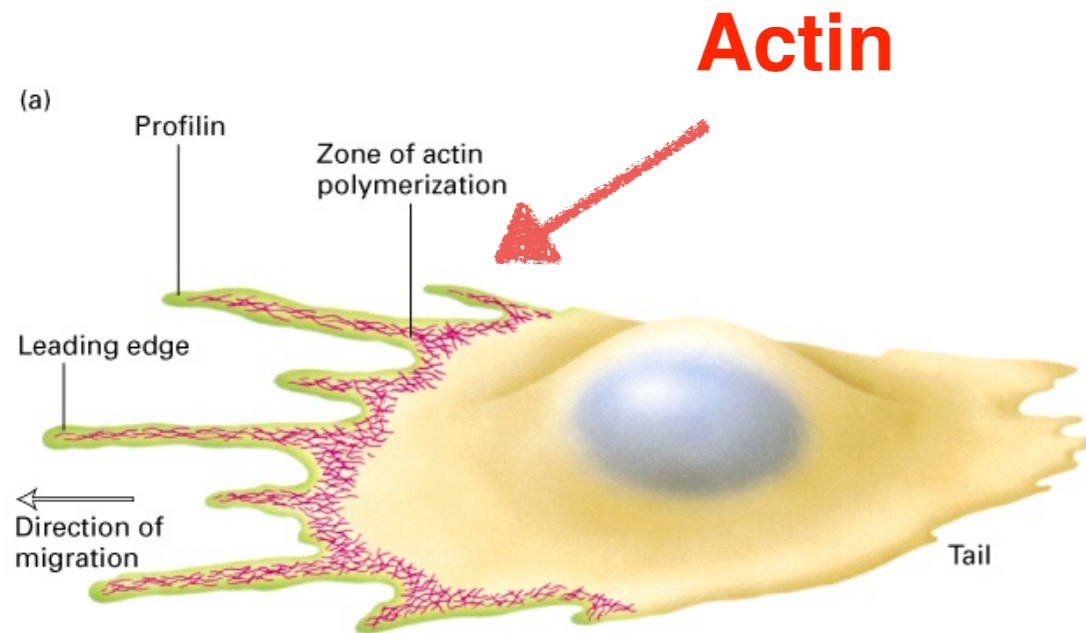
Actin filament



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

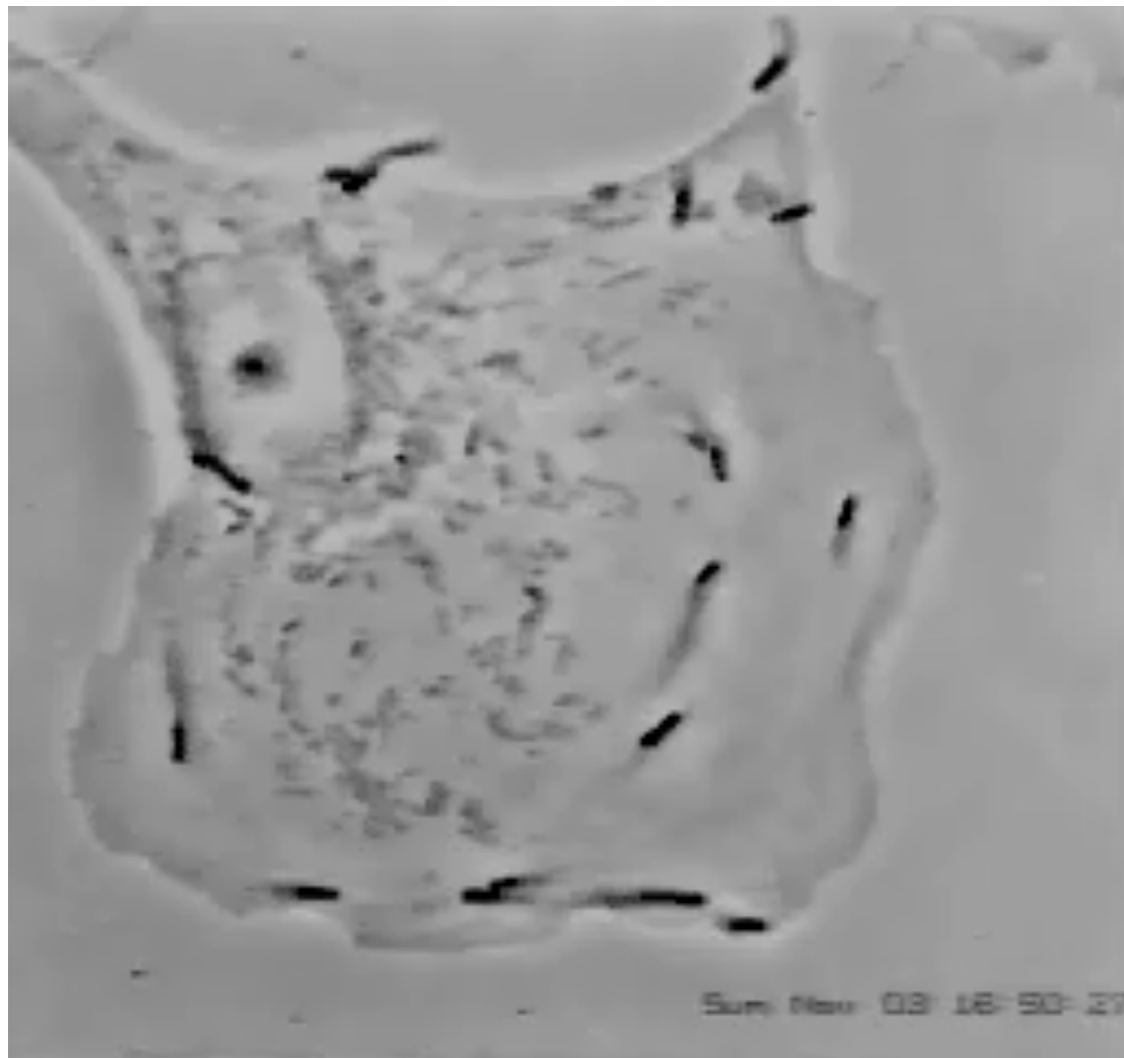


David Rogers, 1950s

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

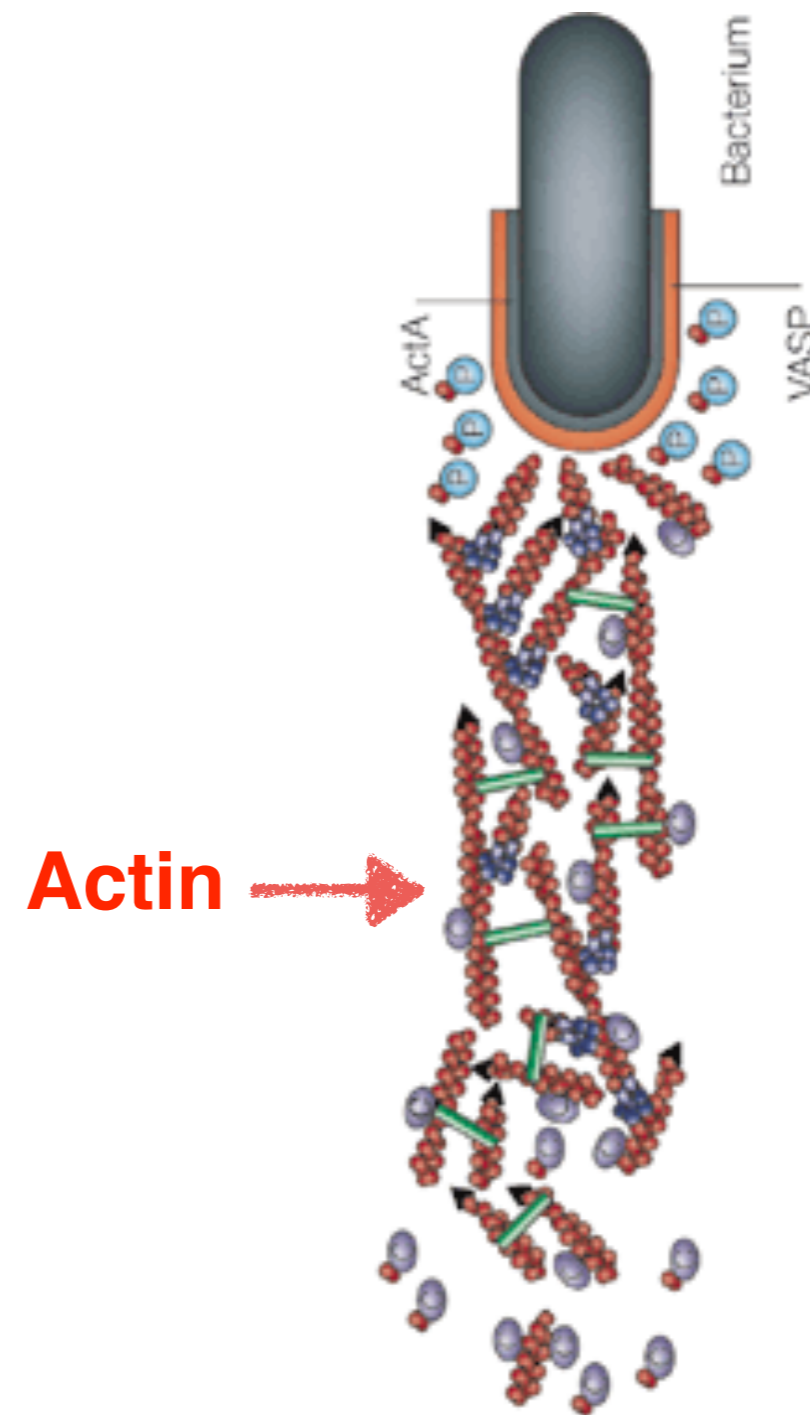
Movement of bacteria

Listeria monocytogenes
moving in infected cells



Julie Theriot (speeded up 150x)

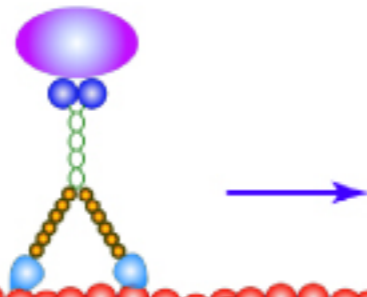
$$v \sim 0.1 - 0.3 \mu\text{m/s}$$



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

Molecular motors

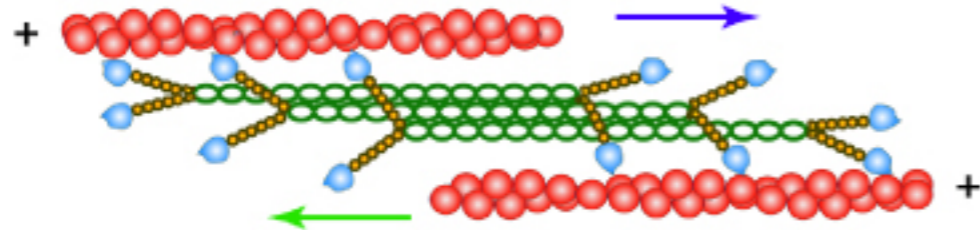
A Myosin V



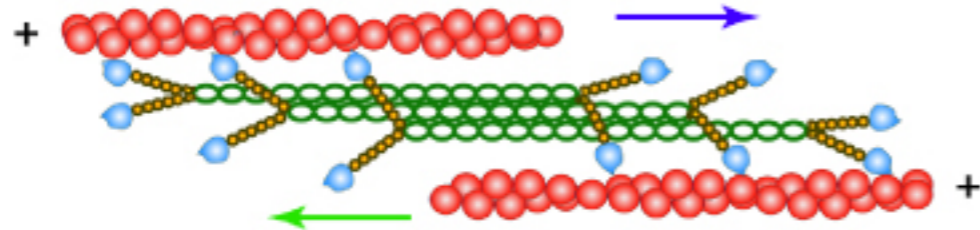
Actin



B Myosin II



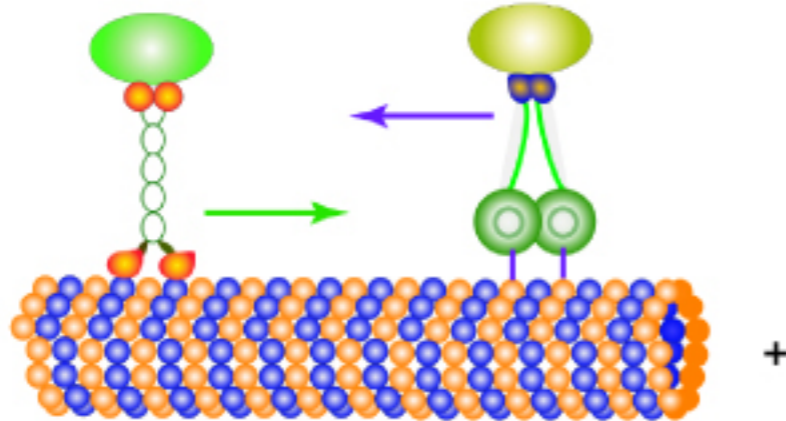
Actin



C

Kinesin-1

Dynein

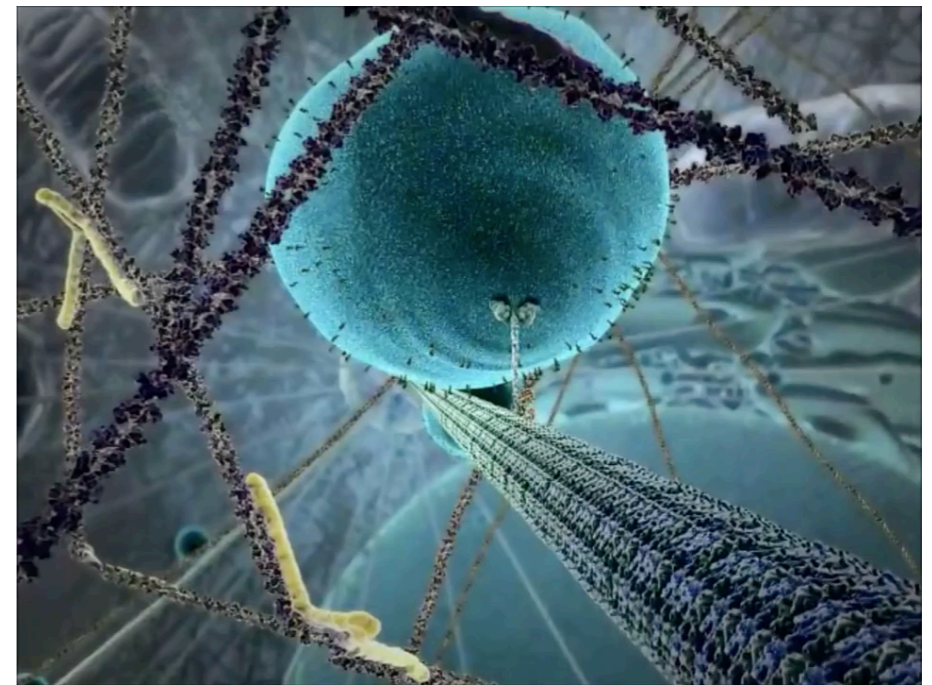


Microtubule

Transport of large molecules around cells
(diffusion too slow)

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

Contraction of muscles

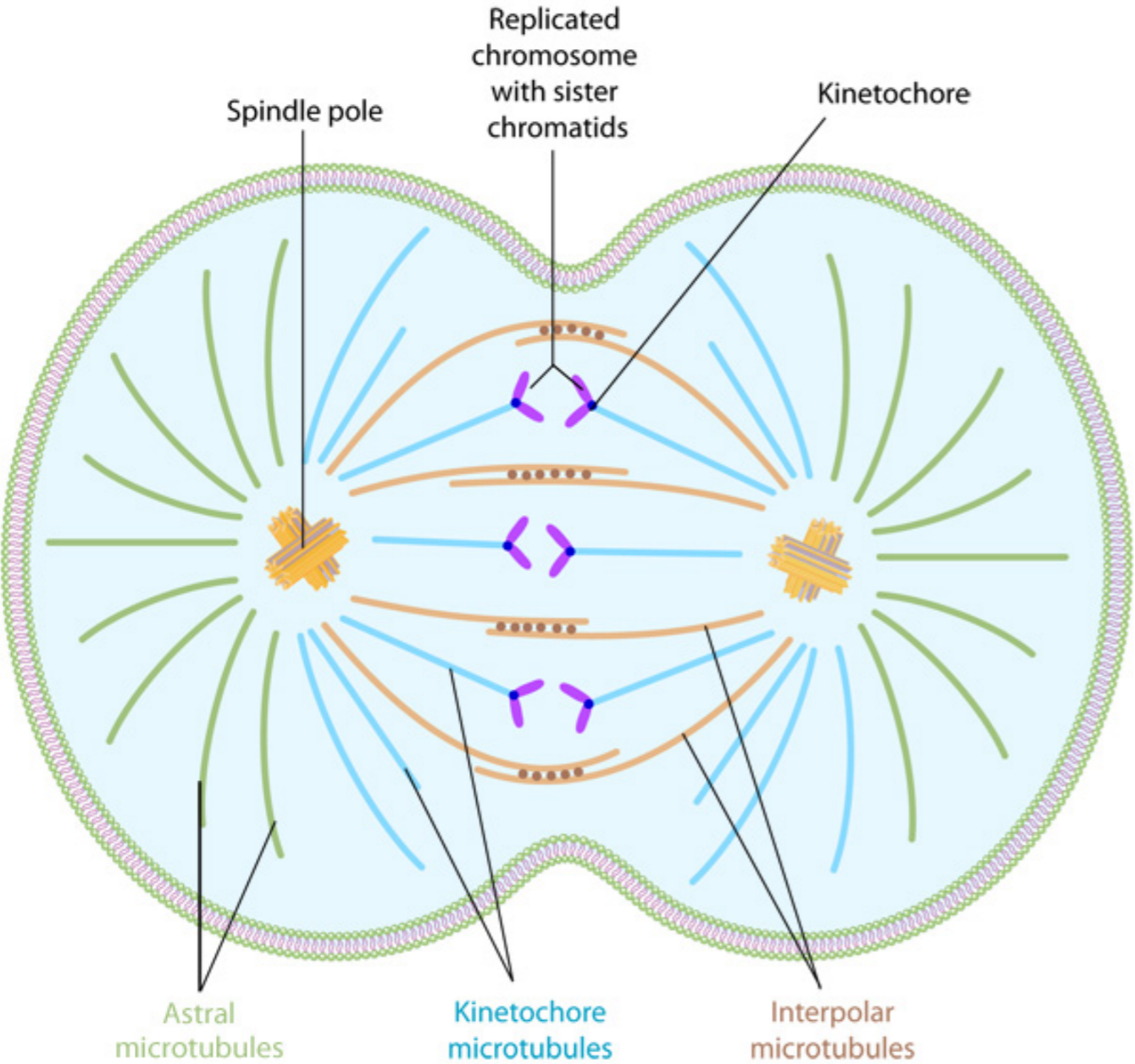


A.B. Kolomeisky, J. Phys.: Condens. Matter **25**, 463101 (2013)

Harvard BioVisions

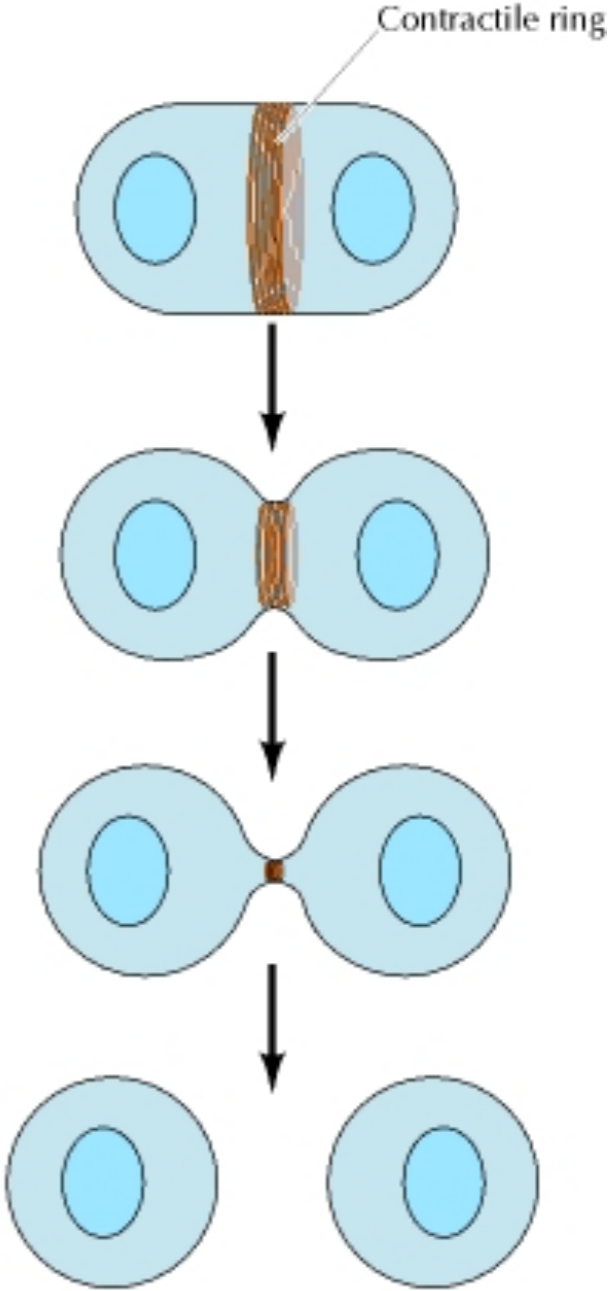
Cell division

Segregation of chromosomes



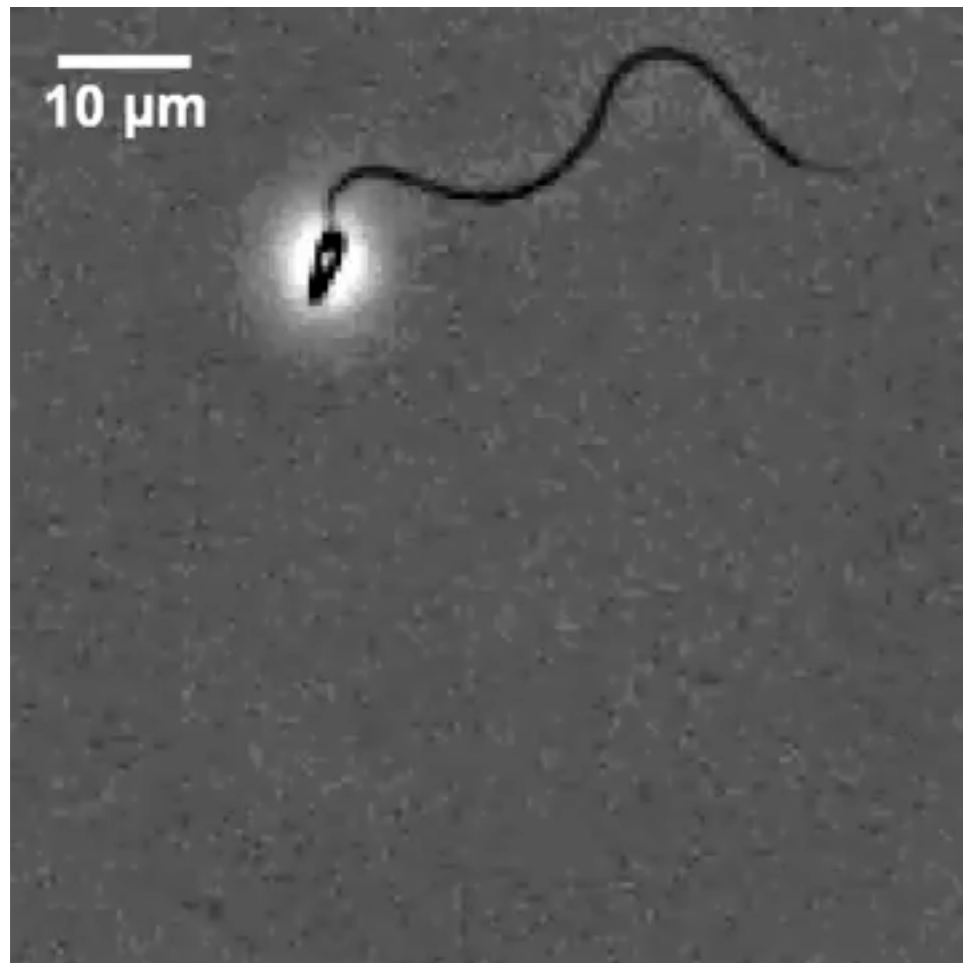
Microtubules

Contractile ring divides the cell in two



Actin

Swimming of sperm cells



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)

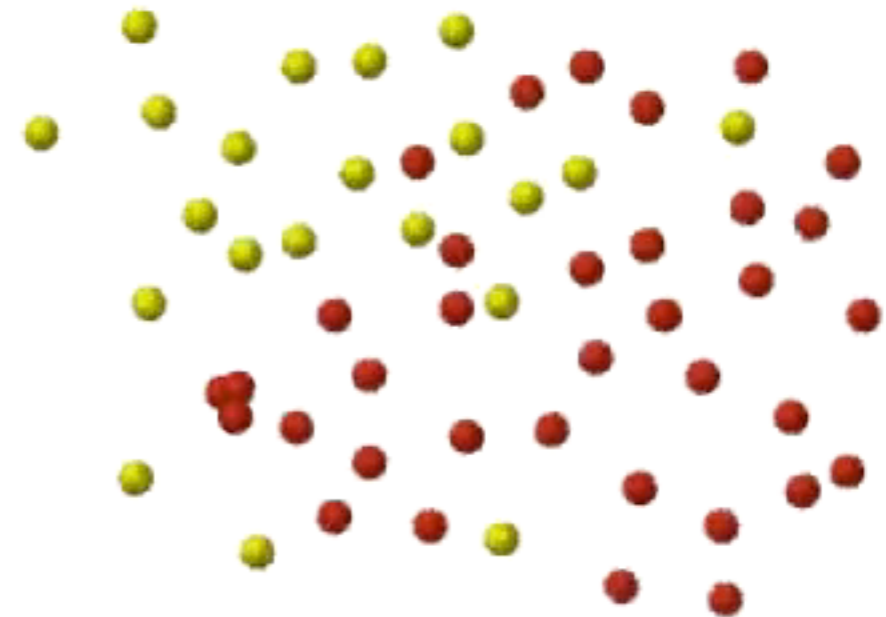
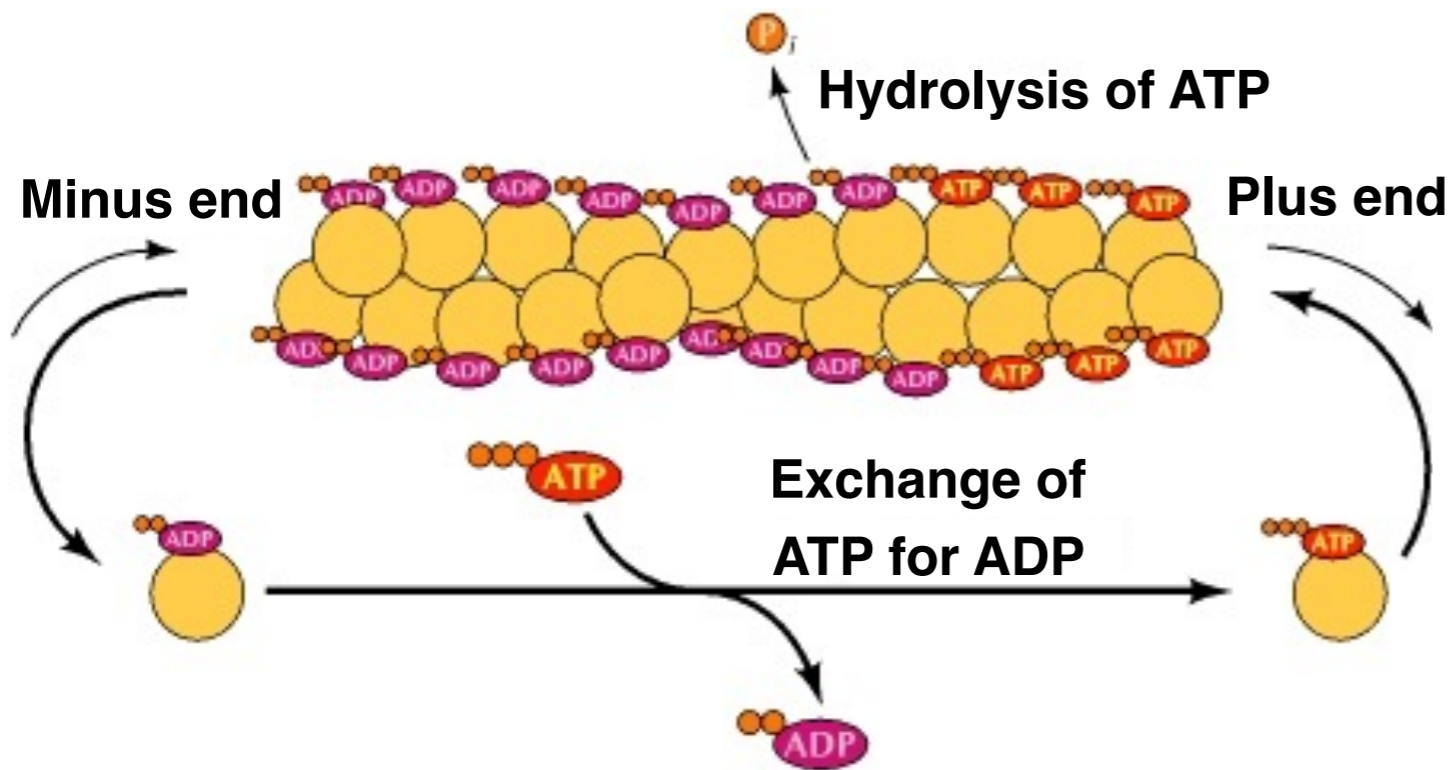
actin
monomer



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

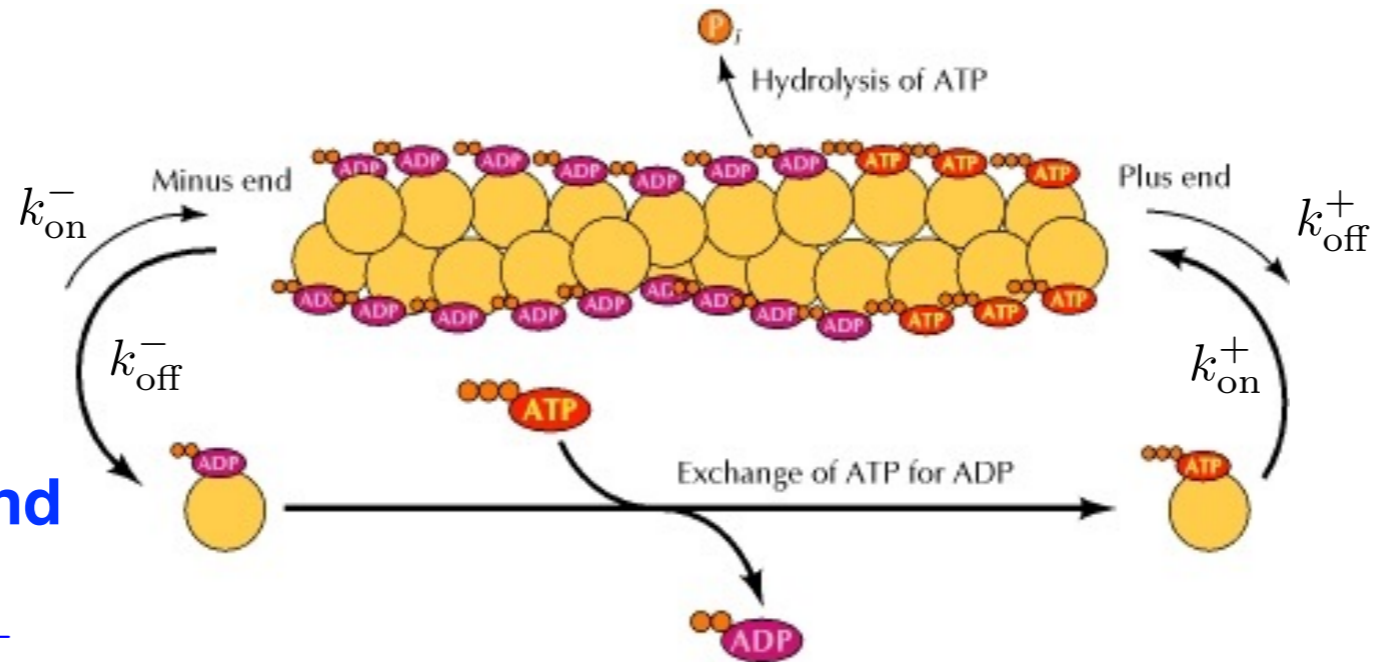
Typical length $L \lesssim 10\mu\text{m}$

Actin treadmilling



● ADP-actin
● ATP-actin

Actin growth



growth of minus end

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

no growth at

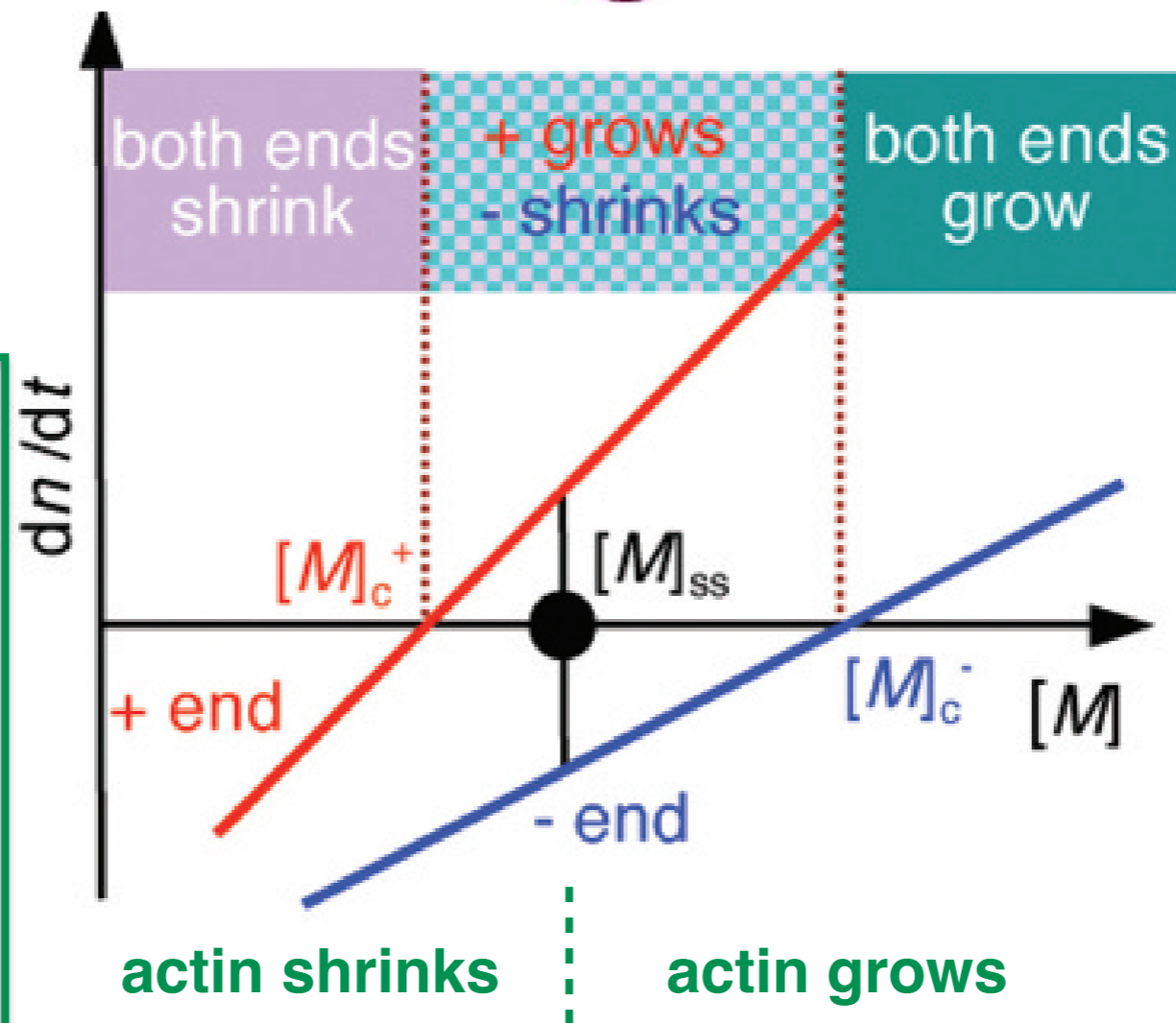
$$[M]_c^- = \frac{k_{off}^-}{k_{on}^-}$$

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

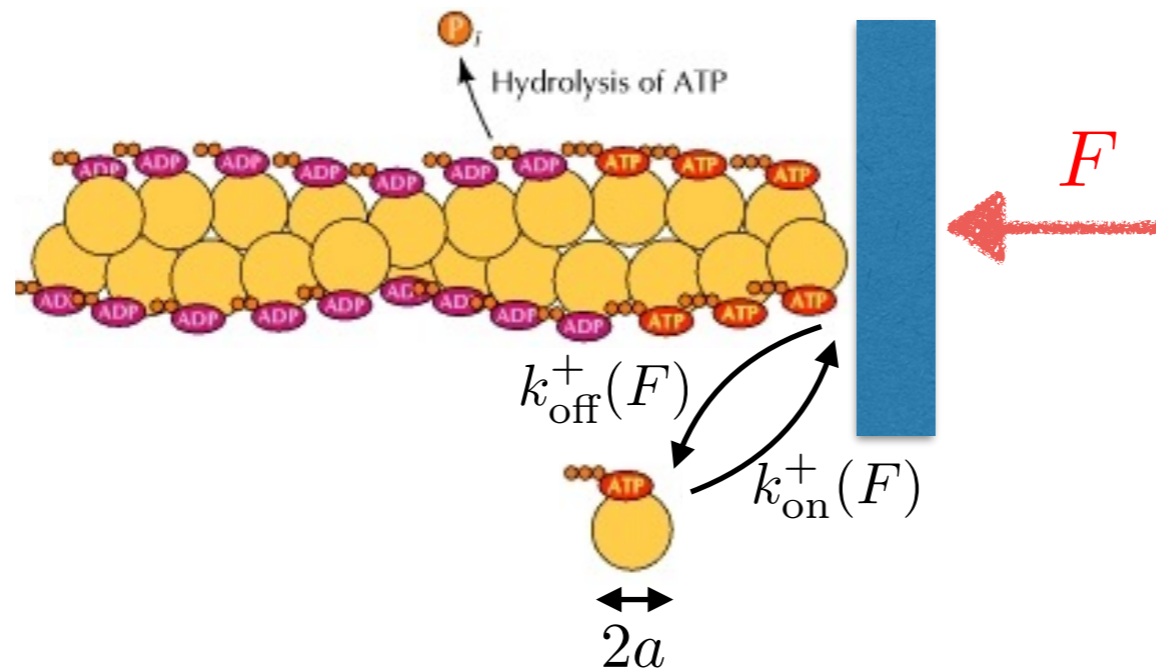
$$\frac{dn^+}{dt} = -\frac{dn^-}{dt}$$

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

front speed

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

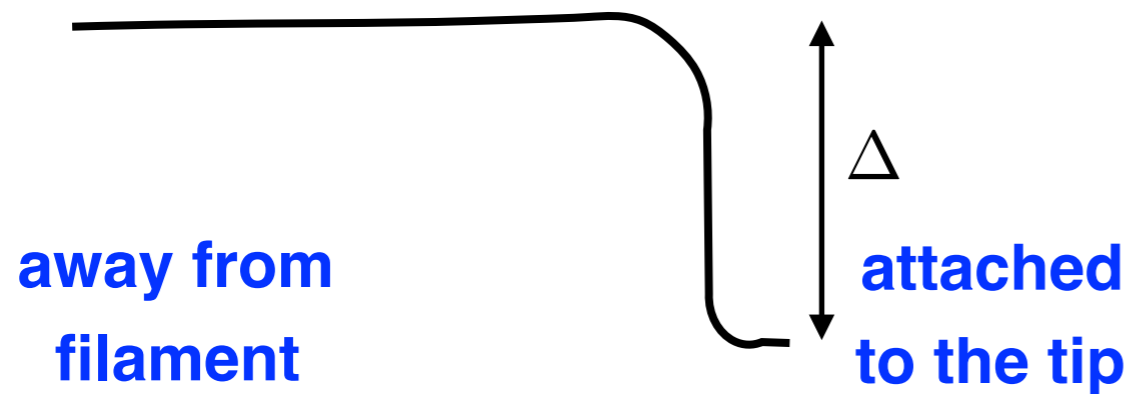
Actin filament growing against the barrier



work done against the barrier for insertion of new monomer

$$W = Fa$$

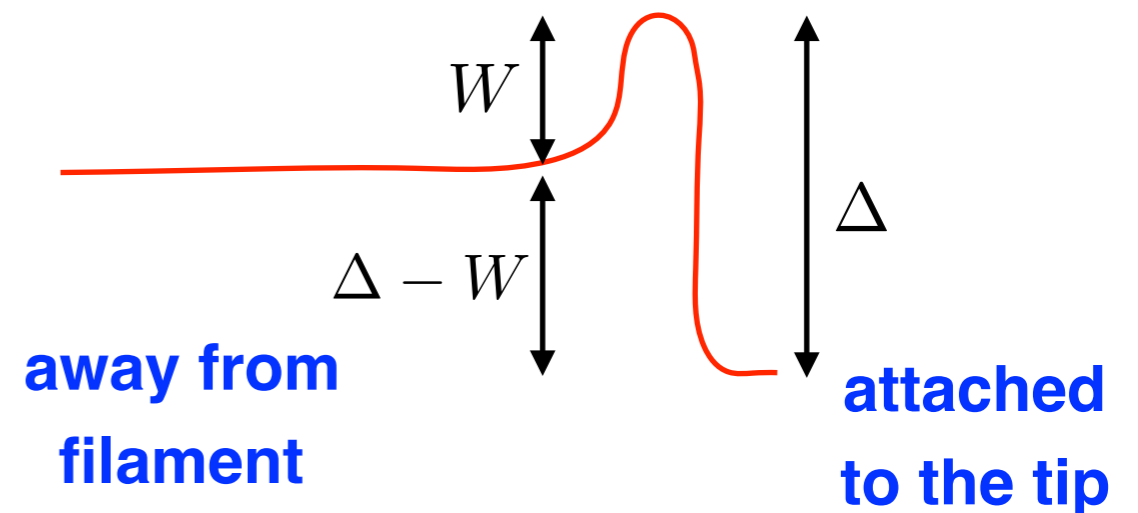
effective monomer free energy potential without barrier



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

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

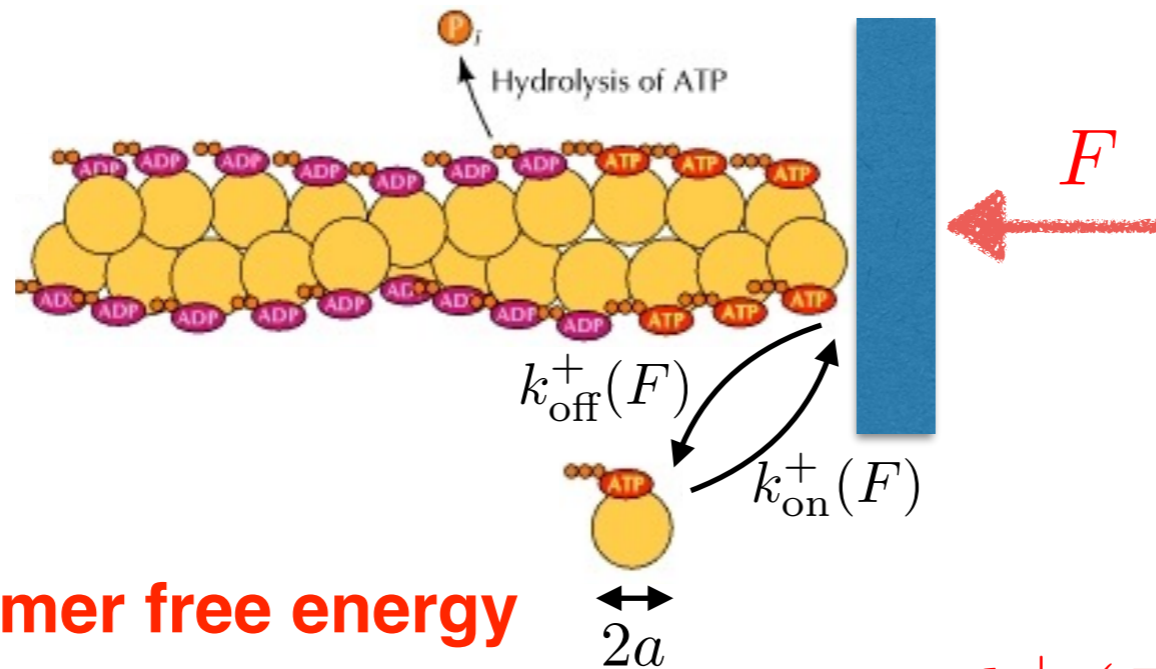
effective monomer free energy potential with barrier



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

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

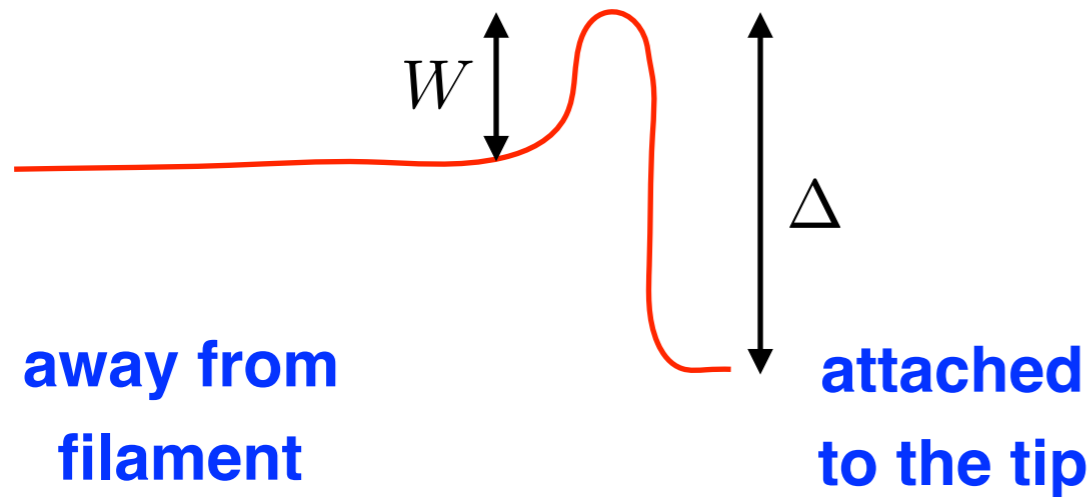
Actin filament growing against the barrier



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)

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

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

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

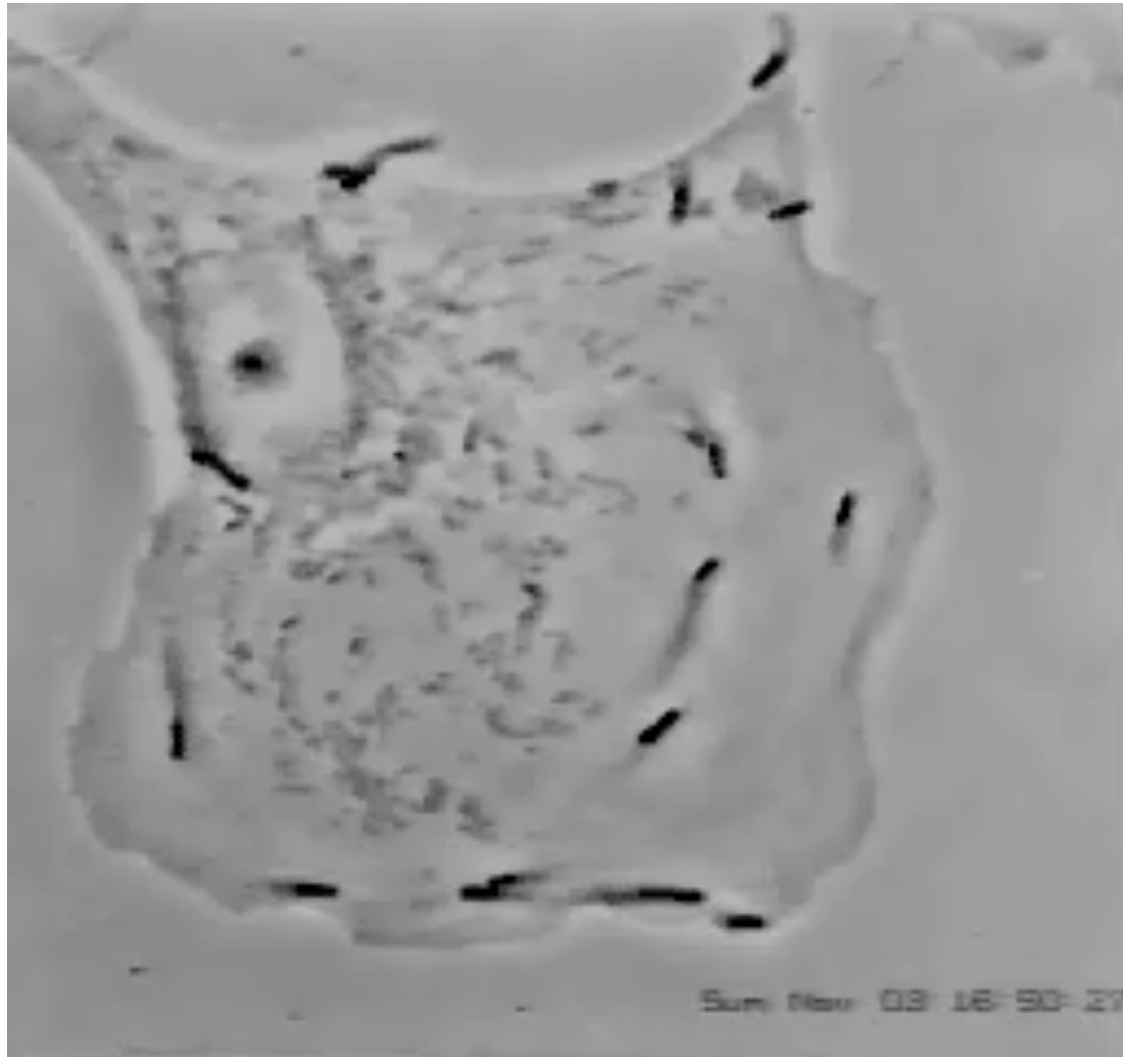
$$[M] \sim 10 \mu\text{M}$$

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

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

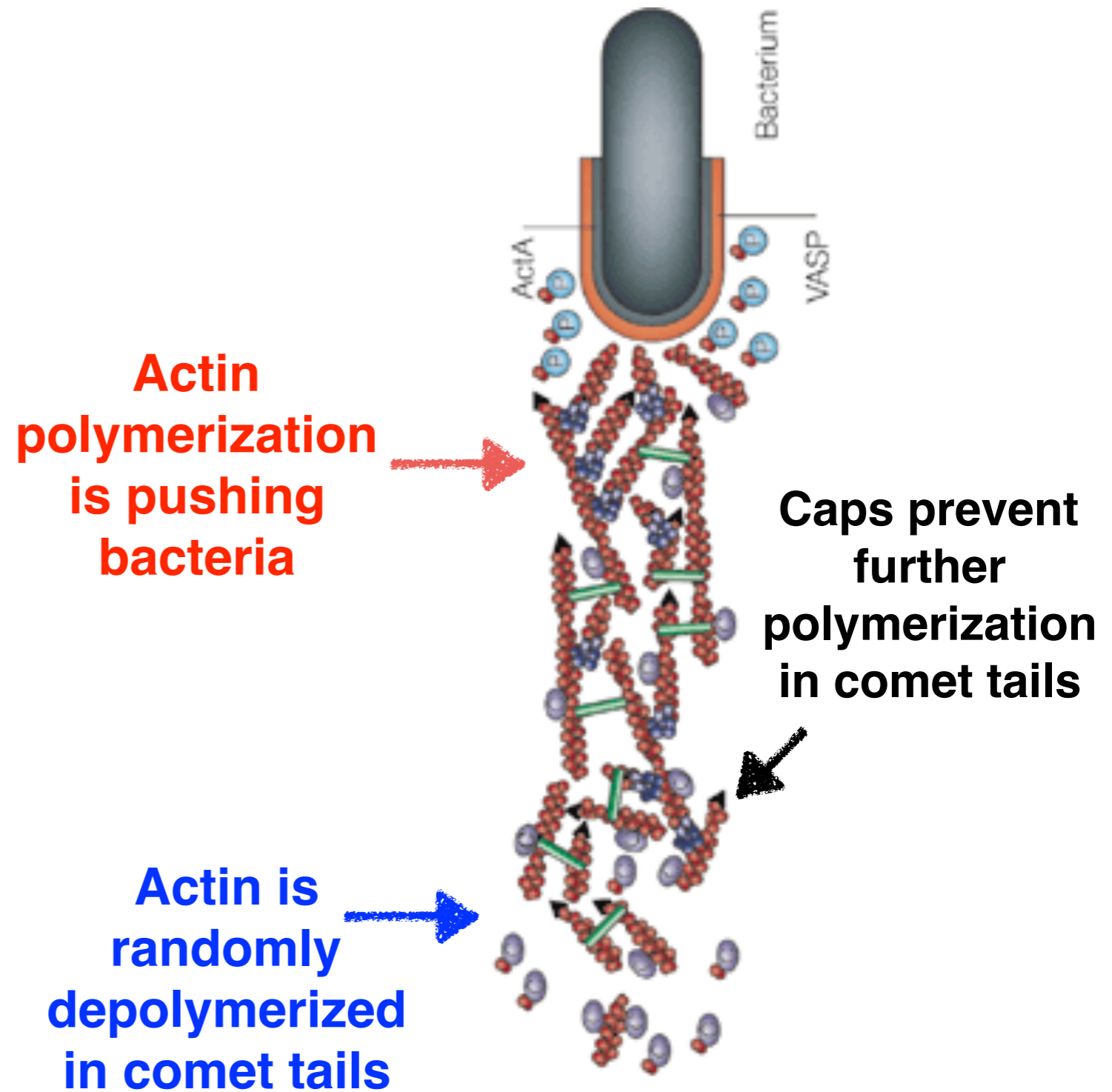
Movement of bacteria

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)