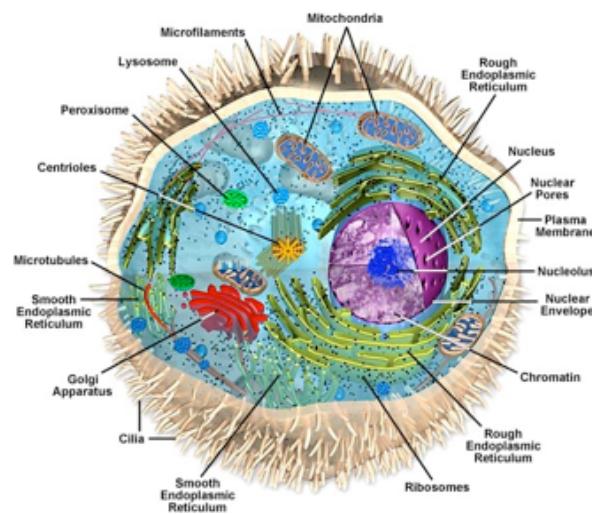


Lund, Feb 17, 2010

# The physics of subcellular processes

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# Department of Astronomy and Theoretical Physics

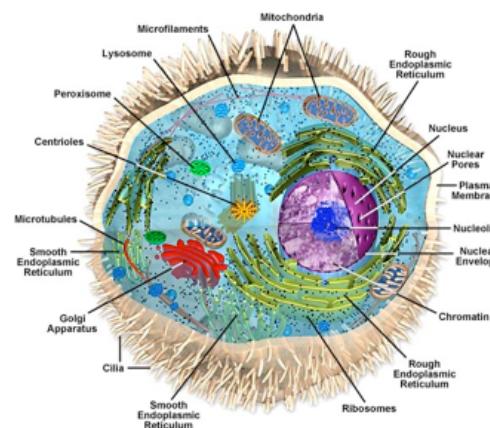
Galaxies,  
Stars,  
Planets(?)



$$10^{20} \text{ m} \rightarrow 10^7 \text{ m}$$

Humans,  
Plants,  
Cells

Computational  
Biology and  
Biological Physics



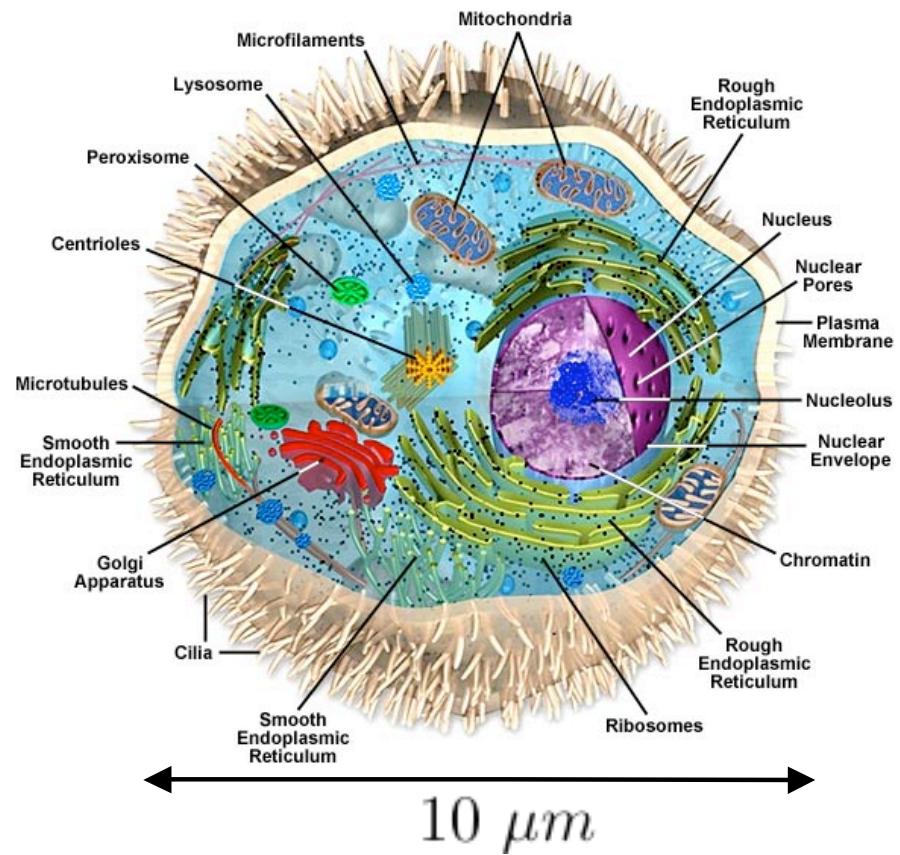
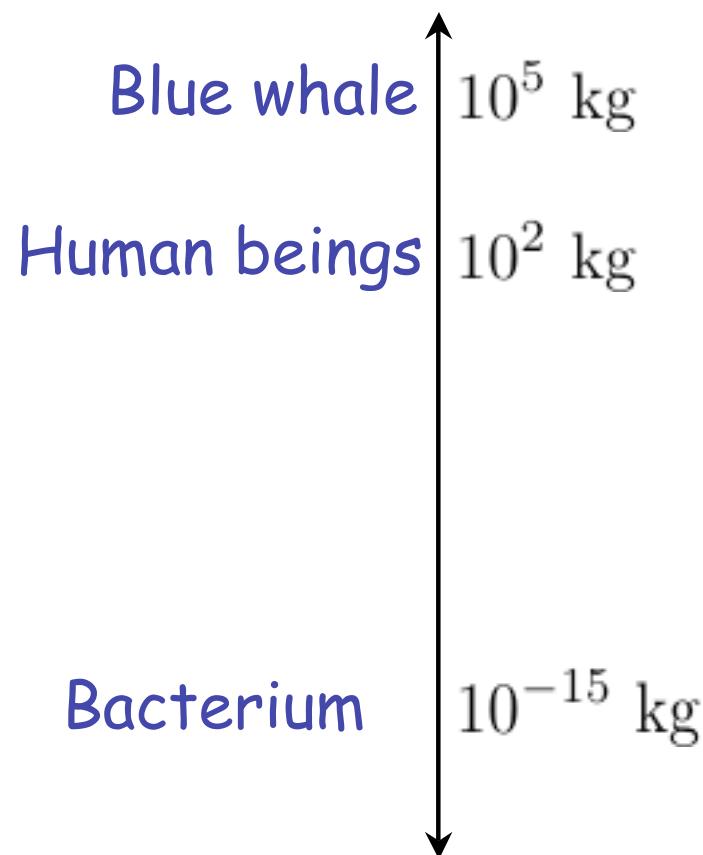
$$10^{-1} \text{ m} \rightarrow 10^{-9} \text{ m}$$

Elementary  
Particles



$$< 10^{-15} \text{ m}$$

# Cells - building block of all living beings



## Subcellular physics, some characteristics:

- $k_B T$ -physics (soft matter)

Typical energies  $\sim k_B T$

( $k_B$ =Boltzmanns konstant,  $T$ =temperatur)

- Low Reynolds numbers

$$\cancel{m \frac{d^2 x}{dt^2}} = -\xi \frac{dx}{dt} + F + \eta(t)$$

Diagram illustrating the Navier-Stokes equation components:

- Inertial term:  $m \frac{d^2 x}{dt^2}$  (crossed out)
- Friktion:  $-\xi \frac{dx}{dt}$
- External force:  $F$
- Stochastic force:  $\eta(t)$

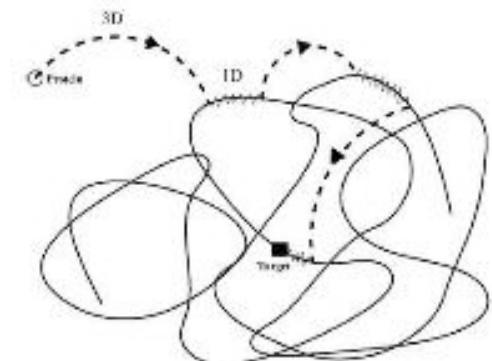
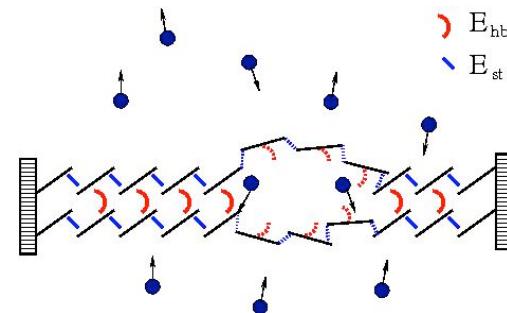
Navier-Stokes  
equations are linear

Aristoles's mechanics: no (net) motion unless there is a force..!

- Heterogeneity is important

## Some projects...

- Biopolymer transport through nanopores in biomembranes
- **DNA melting maps**
- DNA breathing dynamics
- Biomembranes in electric fields
- **Diffusion of proteins on DNA**
- Using localized surface plasmons for sensing biomolecules
- Electromagnetic response of dipole-dipole coupled systems - photosynthesis



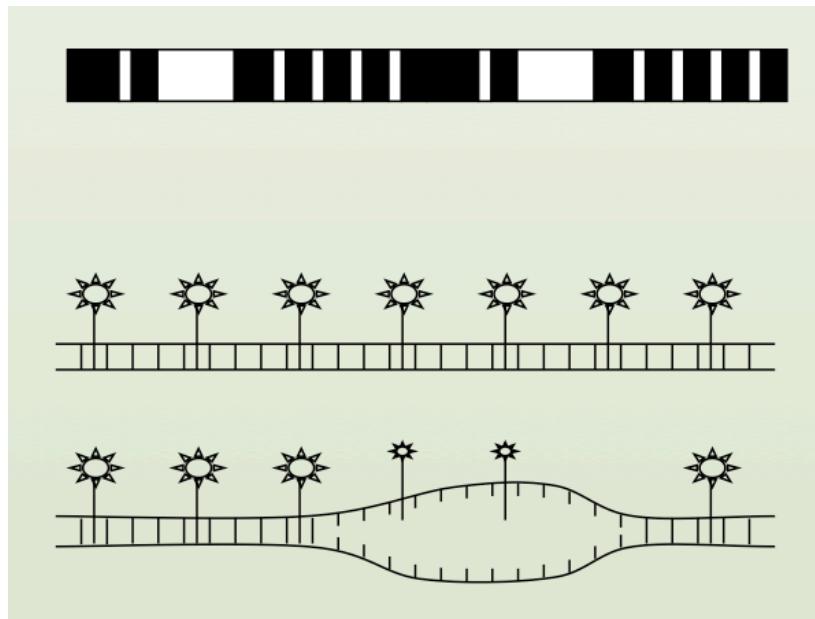
Part I:

DNA melting maps

Ultra-fast discrimination of genomes

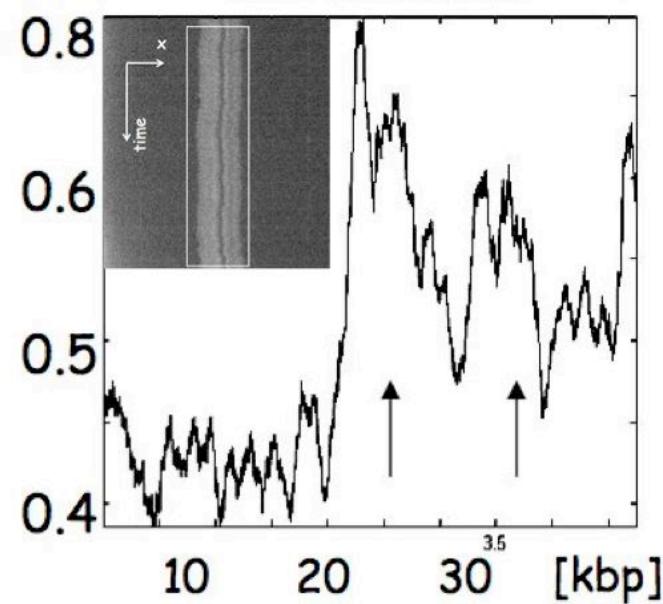
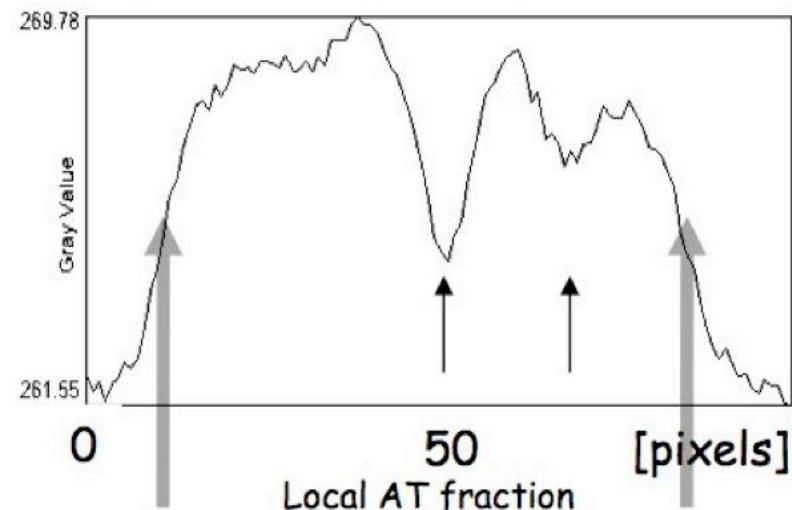


# Experiments



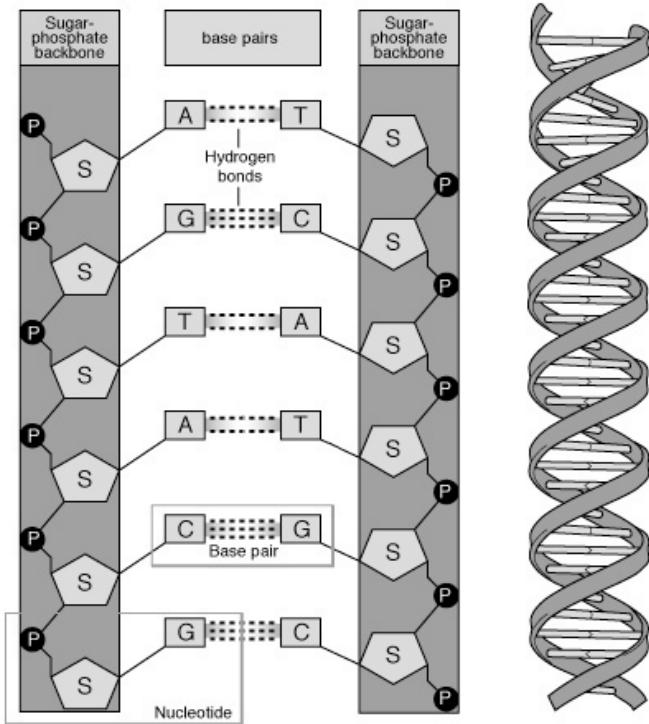
Jonas Tegenfeldt's labs,  
Lund University &  
Göteborg University

Intensity scan along molecule (averaged over box)



# Double-stranded DNA

$d \simeq 2 \text{ nm}$



Available for any  
basepairs, NaCl conc  
and temperature  
[has entropic  
contributions]



## Stability of DNA:

$$u_{st} = \exp(\beta E_{st}) \quad (\text{10 param.})$$

$$u_{hb} = \exp(\beta E_{hb}) \quad (\text{2 param.})$$

$c \approx 1.76$  - loop exponent

$\xi \approx 10^{-3}$  - ring factor

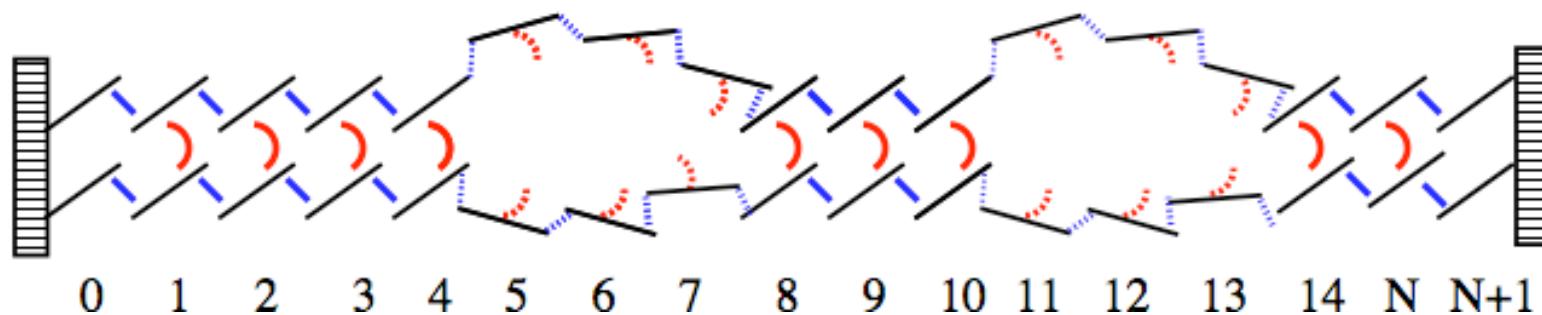
NOTE:  $u_{st}$  only recently  
measured! [Krueger et al,  
Biophys. J. 90, 3091 (2006)]

## The Poland-Scheraga model

→ Ising model with temperature-dependent magnetic field and a "long-range" term

No of configurations for a random walk that returns to the origin =

$$\mu^m m^{-c}$$



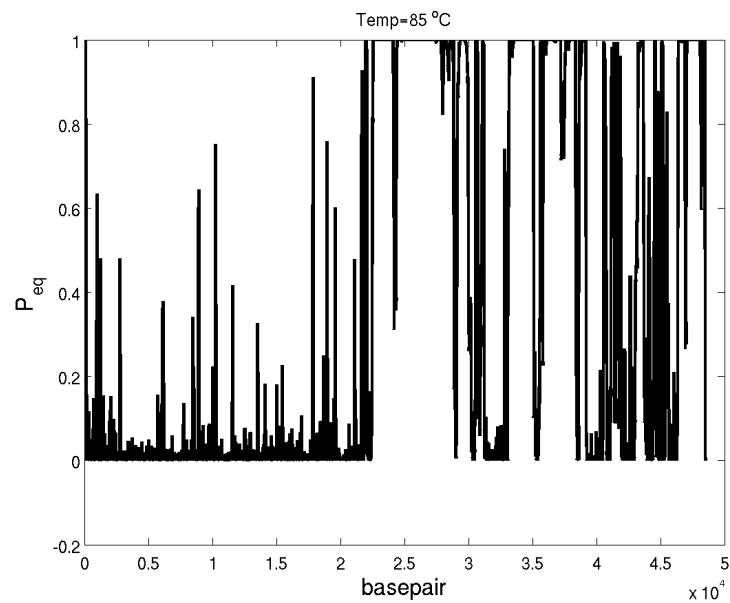
Statistical weight for configuration above:  $[E_{hb} = k_B T \ln \mu + \varepsilon_0]$

$$Z_{\text{weight}} = \xi \exp[\beta E_{st}(4,5)] \exp[\beta E_{hb}(5)] \exp[\beta E_{st}(5,6)] \exp[\beta E_{hb}(6)] \exp[\beta E_{st}(6,7)] \exp[\beta E_{hb}(7)] \exp[\beta E_{st}(7,8)] (8 - 4 + 1)^{-c} \times [\dots]$$

First bubble  
Second bubble

Poland algorithm: partition function etc, can be obtained recursively (scales as  $N^2$ )

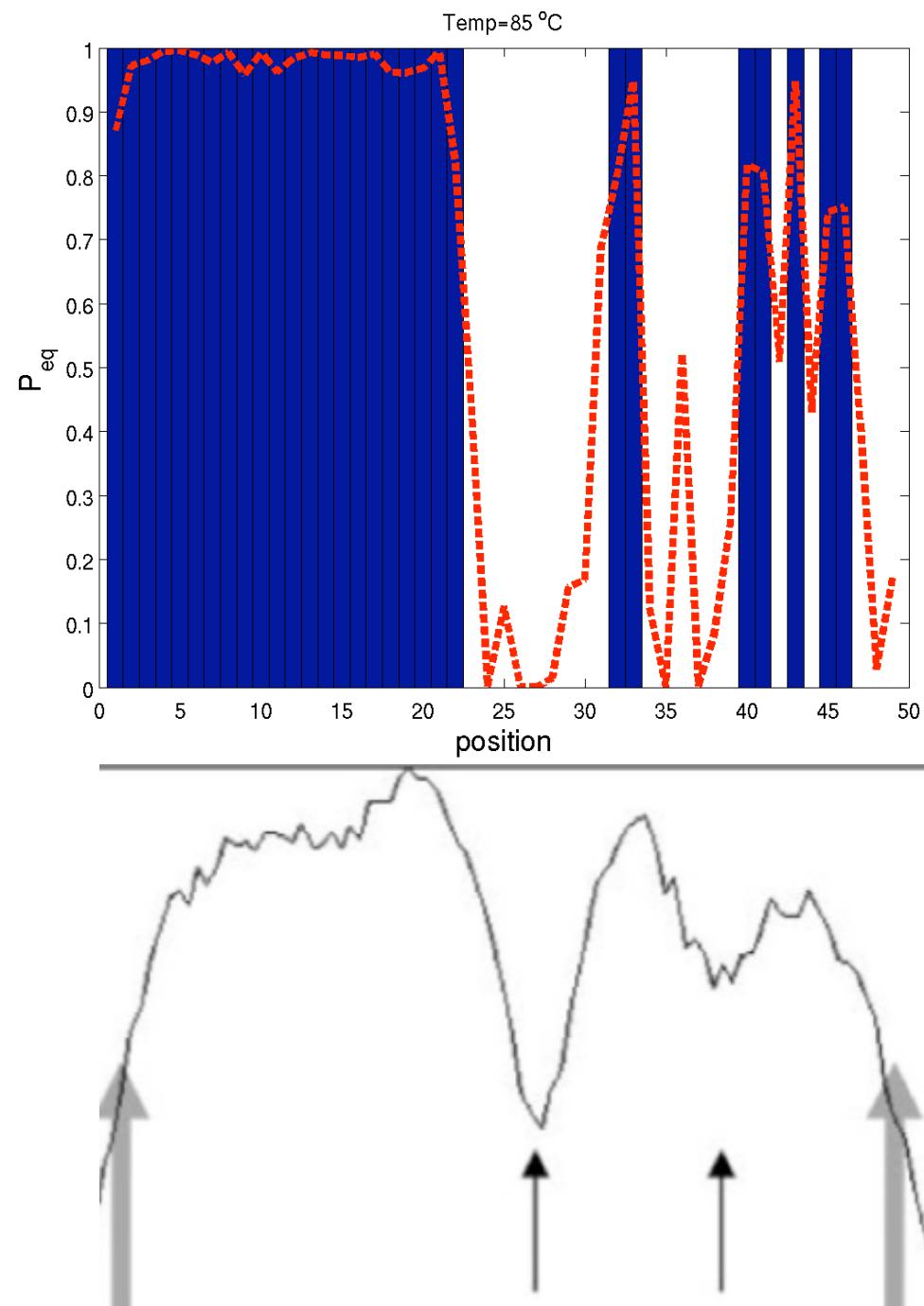
# Case study: $\lambda$ -phage DNA



$T=85\text{ }^{\circ}\text{C}$

100 mM NaCl

$\approx 50000$  basepairs



## Collaborators:

**Jonas Tegenfeldt**  
(Lund and Göteborg Uni.)



**Fredrik Persson**  
(Göteborg University)



**Michaela Schad**  
(Starts her Phd  
May 2010)



**Bosse Söderberg**  
(Lund University)



**Bernhard Mehlig**  
(Göteborg University)



**Lykke Pedersen**  
(MSc student,  
Roskilde University)

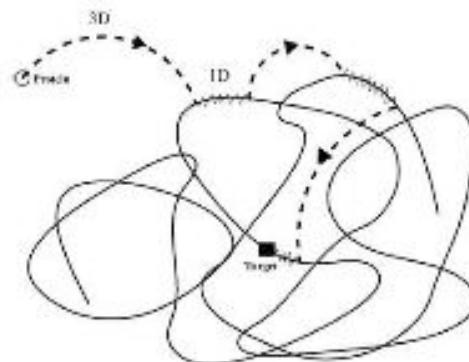
### Previous collaborator (DNA breathing dynamics):

Ralf Metzler (Technical Uni. Munich), Suman Banik (Bose Institute, Kolkata)  
Oleg Krichevsky (Ben-Gurion Uni., Israel), Jonas Pedersen (DTU, Denmark),  
Tomas Novotny (Charles University, Prague), Mikael Sonne Hansen (DTU).

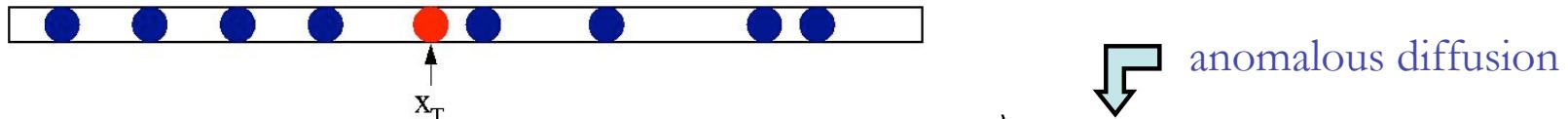
## Part II:

# Diffusion of proteins along DNA

## Single-file diffusion



## Single-file diffusion, basic result

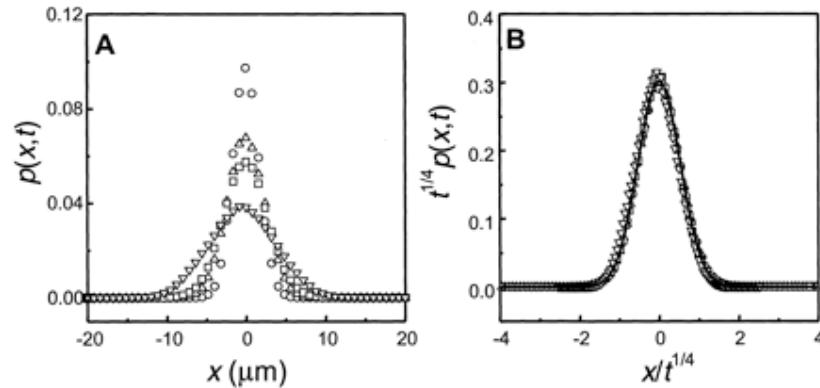


Infinite system (fix concentration):  $\langle (x_T - x_{T,0})^2 \rangle \propto t^{1/2}$

Probability density function (PDF) is Gaussian (T.E. Harris 1965)

anomalous diffusion

First experiments: [Q.C. Wei, C. Bechinger, P. Leiderer, Science 297, 625 (2000)]:



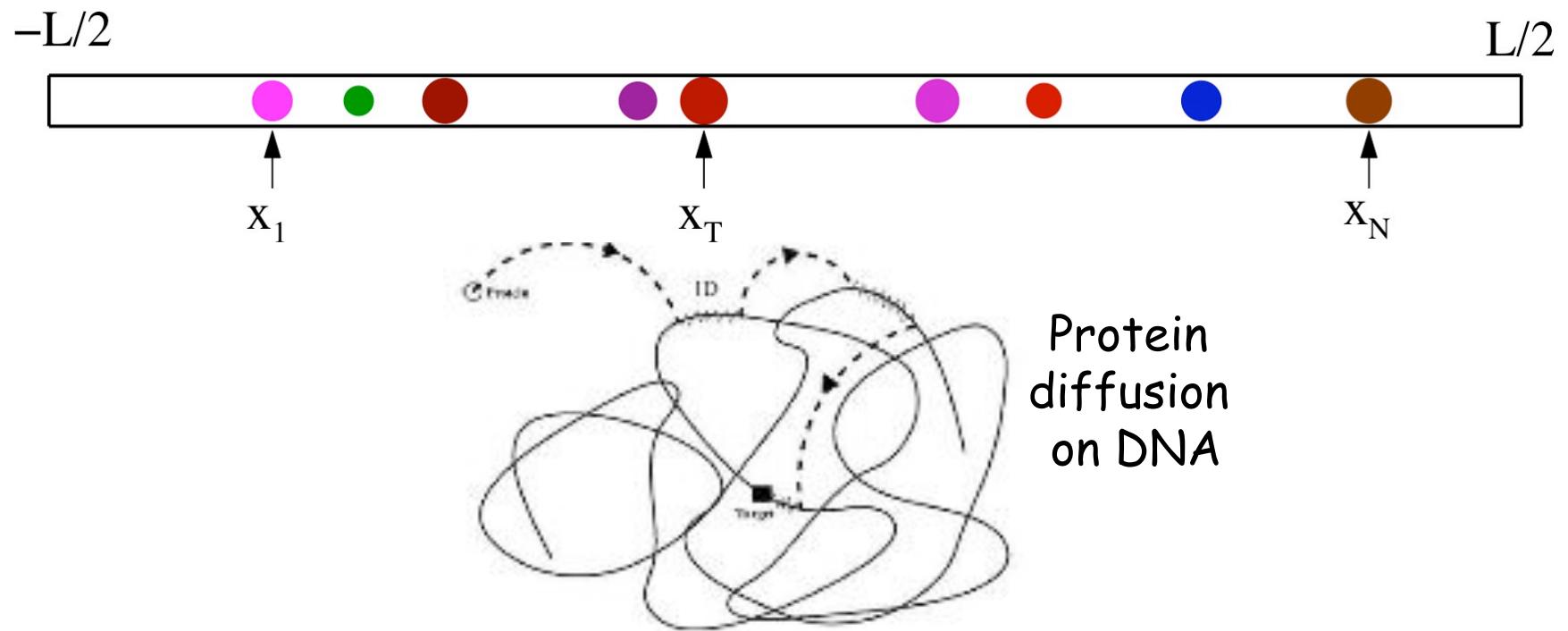
$$\langle (x_T - x_{T,0})^2 \rangle = \frac{1}{\rho} \left( \frac{4Dt}{\pi} \right)^{1/2} \propto t^{1/2}$$

$\rho$  = concentration  
 $D$  = diffusion constant  
for each particle

[ Compare to “ordinary” diffusion  $\langle (x_T - x_{T,0})^2 \rangle = 2Dt$  ]

NOTE: results above for **identical** point-particles!

## SFD with different diffusion constants

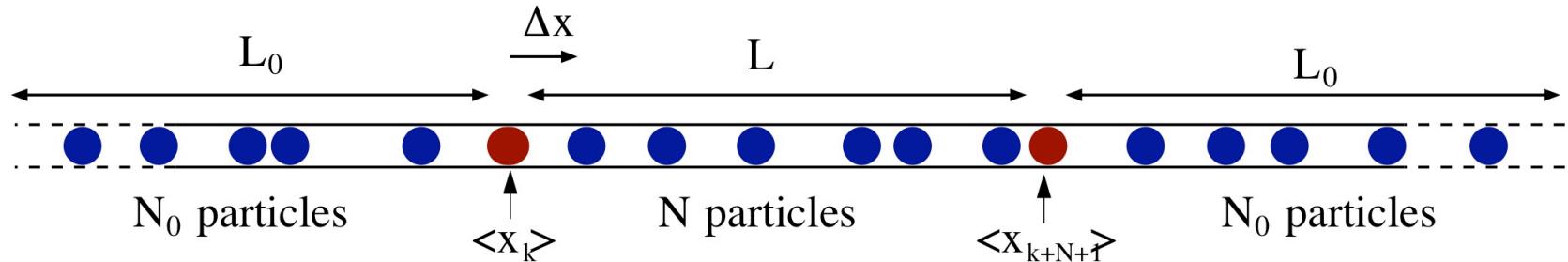


Draw friction constants  $\xi$  from a distribution  $\rho(\xi)$

**Harmonization + Effective medium approach**  
→ problem can solved analytically!



## Harmonization



Entropic force:  $F = \underbrace{\frac{k_B T}{L}}_K \rho \Delta x$

Effective spring constant between neighbours = NK, i.e.

$$\kappa = k_B T \rho^2$$

Proposition: For large distance (long times) the particles behave as (strongly damped) harmonically coupled beads in a heat bath

NOTE: our method can be generalized to any short-range interaction!

## Simplified equations of motion

$$\cancel{m \frac{d^2 x_n}{dt^2} + \xi_n \frac{dx_n}{dt}} = \kappa(x_{n+1} - x_n) - \kappa(x_n - x_{n-1}) + \eta_n(t)$$

Force from left particle      Force from right particle      noise

$\xi_n$ =friction constant= $k_B T/D_n$

The noise is delta-correlated:  $\langle \eta_n(t) \rangle = 0$

$$\langle \eta_n(t) \eta_m(t') \rangle = k_B T \xi_n \delta_{n,m} \delta(t - t')$$

Eq. of motion for (1D) polymer!

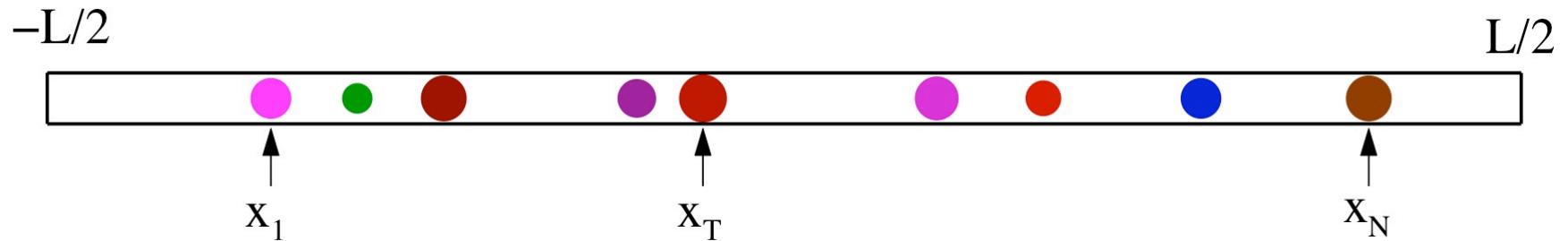
For identical particles the solution  
(in double Fourier-space) is  
(continuum limit):

$$x_q(\omega) = \frac{\eta_q(\omega)}{\kappa q^2 - i\omega\xi}$$

Going back to real time and space:

$$\begin{aligned} \langle [x_n(t) - x_n(0)]^2 \rangle &= \frac{2k_B T}{\kappa} \int_{-\infty}^{\infty} \frac{dq}{2\pi} \frac{1}{q^2} (1 - e^{-(\kappa/\xi)q^2 t}) \\ &= \left( \frac{k_B T}{\kappa} \right)^{1/2} \left( \frac{4Dt}{\pi} \right)^{1/2} = \frac{1}{\rho} \left( \frac{4Dt}{\pi} \right)^{1/2} \end{aligned} \quad (!!)$$

Different particles,  $\xi_1 \neq \xi_2 \neq \xi_3 \neq \dots \neq \xi_N$



Draw friction constants  $\xi$  from a distribution  $\rho(\xi)$

### **Harmonization + Effective medium approach**

- we can identify two classes of systems

- “Nice” distribution with  $\langle \xi \rangle = \int \xi \rho(\xi) d\xi < \infty$
- (Power-law) distribution with  $\langle \xi \rangle = \int \xi \rho(\xi) d\xi = \infty$

[M. Lomholt, L. Lizana, T. Ambjörnsson, in preparation]

## Different $\xi$ - nice distributions, $\langle \xi \rangle < \infty$

$$\langle (x_T - x_{T,0})^2 \rangle = \frac{1}{\rho} \left( \frac{4D_{eff}t}{\pi} \right)^{1/2} \propto t^{1/2}$$

where

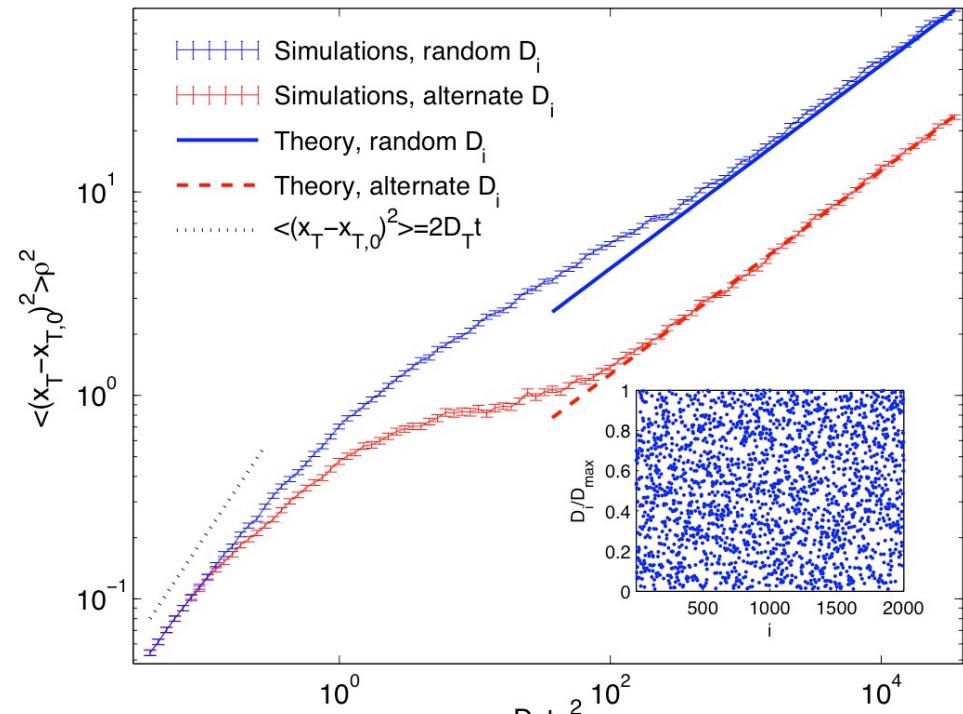
$$D_{eff} = \frac{k_B T}{\xi_{eff}}$$

$$\xi_{eff} = \int \xi p(\xi) d\xi$$



Average over friction constants

M. Jara and P. Gonçalves,  
J. Stat. Phys. 132, 1135 (2008)  
for lattice systems.



T.A, L. Lizana, M.A. Lomholt and R.J. Silbey,  
J. Chem. Phys. 129, 185106 (2008).

## Different $\xi$ - Power-law distributions, $\langle \xi \rangle = \infty$

Take friction constants  
from a power-law distributions:

$$\rho(\xi) \propto \xi^{-1-\alpha}, 0 < \alpha < 1$$

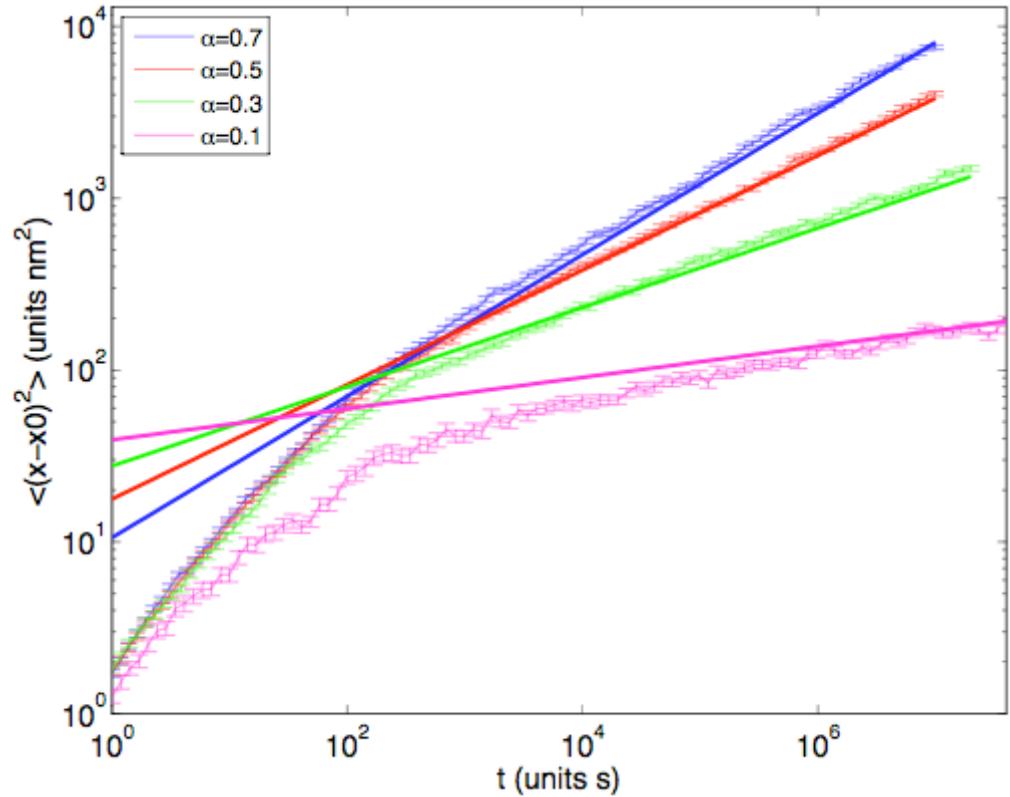
for large  $\xi$ . Then

$$\langle [x_T(t) - x_T(0)]^2 \rangle \propto t^\delta$$

where

$$\delta = \frac{\alpha}{1+\alpha} < \frac{1}{2}$$

ultra-slow dynamics!



## Further results

### Nice distributions

- If harmonically time-varying force acts on the tagged particle there is a phase lag  
[ $\delta = \alpha / (1 + \alpha)$ ]

$$\phi_0 = \frac{\pi}{4}$$

- The density relaxations (dynamic structure factor) is:

$$S(Q,t) = \exp[-D_c Q^2 t]$$

### Power-law distributions

$$\phi_0 = \frac{\delta\pi}{2}$$

$$S(Q,t) \propto E_{2\delta}[-CQ^2 t^{2\delta}]$$



Mittag-Leffler function

[M. Lomholt, L. Lizana, T. Ambjörnsson, in preparation]

## Collaborators:

**Michael Lomholt**

(University of Southern Denmark)



**Ludvig Lizana**

(Niels Bohr Institute, Denmark)



**Alessandro Taloni**

(Tel Aviv University, Israel)



**Eli Barkai**

(Bar Ilan University, Israel)



**Robert Silbey**

(MIT, USA)



**Lloyd Sanders**

(Just started his PhD)



**Karl Fogelmark**

(MSc student working  
on a similar topic)

**Thanks:** Milton Jara, Mehran Kardar, Igor Sokolov, Ed Di Marzio,  
Ralf Metzler, Knut&Alice Wallenberg Foundation

# Summary

- Subcellular processes occur on length scales 1 nm-10 $\mu$ m:  $k_B T$ -physics, low Reynolds numbers and heterogeneity

- DNA melting maps: ultra fast DNA discrimination, disordered Ising model with long-range coupling



- Protein diffusion along DNA: Solvable many-body problem. Harmonization + effective medium  $\rightarrow$  mean square displacement for a tagged particle  $\sim t^\delta$  with  $\delta \leq 1/2$  for the case of distributed diffusion constants.

