





# Molecular modeling of polymers: An introduction



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- Introduction to polymers
- Chemical structure of polymers
- Polymer models
- Polymer statistics
- How to simulate polymers
- Simplifications, counterion condensation

# History

- Polymers ≜ many particles
- H. Staudinger (1881-1965), Nobel Price for Chemistry 1953: suggested the existence of covalent bounded monomers (1920)→ Polymers

So far people believed that Polymers were disordered conglomerates of small molecules

- 1928: Proof of the existence of Polymers
  - Structure revealed via X-Ray scattering by P. Debye (1884-1966), Nobel
     Prize for chemistry in 1936
  - Other important people:

W. Kuhn (1899-1963)

P. Flory (1910-1985) 1974 Nobel Prize for Chemistry

S. F. Edwads (1928-) Feynman Path Integrals for Polymers

P.G. de Gennes (1932- 1991 Nobel Prize for Physics

(LC and Polymers)



# History up to Modern Times

Within 10 years of polymer science attitude changed from:

Impossible  $\rightarrow$  maybe it's true  $\rightarrow$  "Oh well, that's well known!"

1928: Du Pont → Nylon

1930: PVC, Teflon, polyurethane, polystyrene

Plastics means "able to be modelled"

Now we have more promising fields: organic electronics, solar cells, polymer batteries....

Semi-conducting polymers, Electrochemical Transistors



# **Examples for Polymers**

$$\begin{bmatrix} CI \\ | \\ -CH_2-C- \\ | \\ H \end{bmatrix}_n$$

polyvinylchloride, PVC



# Physical Chemistry of Polymers

If more than one group is attached to a main C atom, different spatial arrangements are possible (e.g. see Polystyrene)

<u>Tacticity:</u> atactic no regularity in the chemical structure

isotactic completely regular attachment pattern

syndiotactic regular and alternating attachment

pattern

Homopolymer single type of repeat unit

Copolymers: more than one type of repeat unit, i.e. A, B

random copolymer: random arrangement of blocks

ABBAABAB (quenched)

block copolymer: Different monomers are arranged in

AAAABBBB blocks of homopolymers: di-, tri-,

multiblock copolymers



# Polymer Architectures

<u>Linear Polymers:</u> completely characterized by the degree of polymerization **n** 

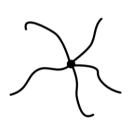
Branched polymers:



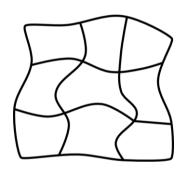
Polymer with short and Polymer with short and Oligonia



Polymer with grafted oligomeric side chains



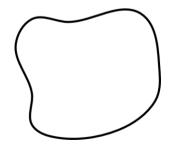
Star polymers



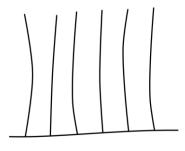
Network of crosslinked chains (rubber)



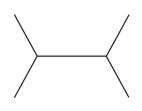
**Dendrimers** 



Ring polymers



Combs



H-branched



Ladder



# Polymer Solutions

For uncharged polymers one normally needs organic solvents charged polymers are soluble in water

Overlap volume fraction 
$$\phi^*=rac{NV_{mon}}{V}$$
: monomer volume  $Vpprox R^3$ , R size of polymer or polymer density

 $\varrho$ : polymer density

Overlap concentration 
$$c^* = \varrho \phi^* = \frac{\varrho N \ V_{mon}}{V}$$

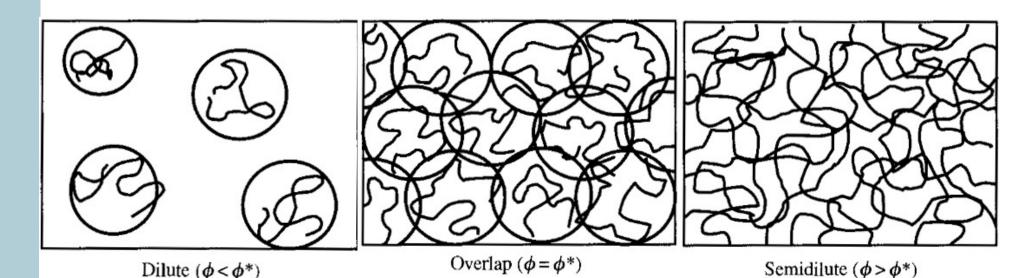
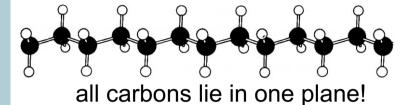


Fig. from M. Rubinstein, R. Colby, Polymer Physics

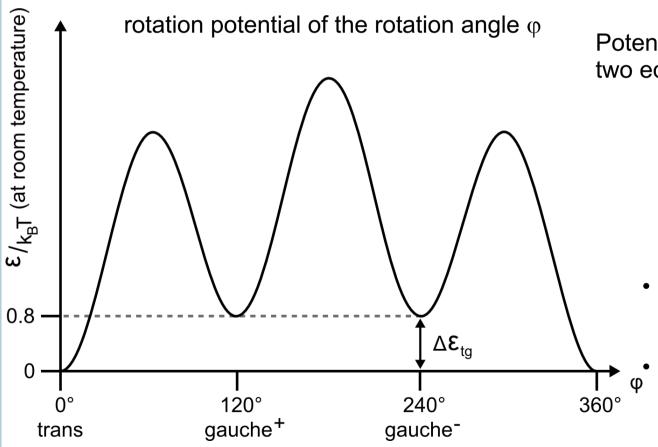


# Origin of Flexibility of Polymers

### Polyethylene:



bond length I  $\sim 1.54$  Å (const!  $\pm 0.05$  Å) tetrahedral angle  $\Theta = 68^{\circ}$  almost const.  $R_{\text{max}} = \text{nl cos}(\Theta/2)$ 



Potential energy shows two equal minima at

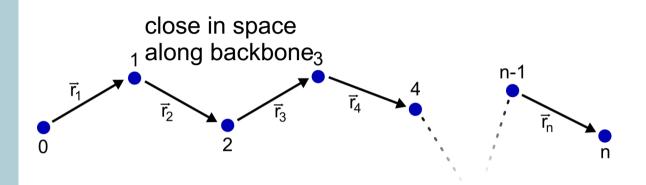
120° gauche<sup>+</sup> 240° gauche<sup>-</sup>  $\Delta \varepsilon_{tg} = 0.8 k_B T$ 

- all different rotational isomeric states can be occupied
- large conformational state space



# Ideal Chain Conformations

only <u>local</u> interactions between monomers





$$\begin{aligned} \vec{R}_n &= \sum_{i=1}^n \vec{r}_i \\ \left\langle \vec{R}_n \right\rangle &= 0 \\ &= \sum_{i=1}^n \langle \vec{r}_i \rangle \end{aligned}$$

"End-to-End vector"

no preferred orientation in each step mathematically described as a random walk

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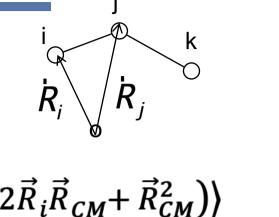
ensemble average over all possible states of the system (i.e. many chains or many realizations of one chain)



# Radius of Gyration

### $\vec{R}_i$ position vector of monomers

$$\vec{R}_{CM} \equiv \frac{1}{N} \sum_{j=1}^{N} \vec{R}_{j}$$
 (set all masses to unity)



$$\langle R_{G}^{2} \rangle = \frac{1}{N} \langle (\vec{R}_{i} - \vec{R}_{CM})^{2} \rangle = \frac{1}{N} \langle \sum_{i=1}^{N} (\vec{R}_{i}^{2} - 2\vec{R}_{i}\vec{R}_{CM} + \vec{R}_{CM}^{2}) \rangle$$

$$= \frac{1}{N^{2}} \langle \sum_{i,j}^{N} (\vec{R}_{i}^{2} - 2\vec{R}_{i}\vec{R}_{j} + \vec{R}_{i}\vec{R}_{j}) \rangle = \frac{1}{2N^{2}} \sum_{i,j}^{N} \langle \vec{R}_{i}^{2} - 2\vec{R}_{i}\vec{R}_{j} + \vec{R}_{j}^{2} \rangle$$

$$= \frac{1}{2N^{2}} \sum_{i,j}^{N} \langle (\vec{R}_{i} - \vec{R}_{j})^{2} \rangle$$

### Following relations can be proven:

ideal chain: 
$$\frac{\langle R_n^2 \rangle}{\langle R_G^2 \rangle} = \epsilon$$

rod: 
$$\frac{\langle R_n^2 \rangle}{\langle R_G^2 \rangle} = 12$$

uniform sphere : 
$$\frac{\langle R_n^2 \rangle}{\langle R_G^2 \rangle} = \frac{5}{3}$$
 of radius R



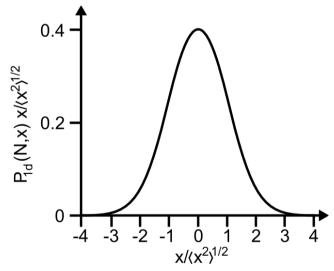
# **End-to-End Distance Distribution**

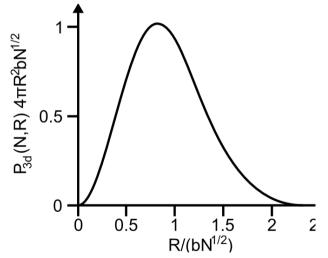
$$P(\vec{R}, N) = \left(\frac{2\pi Nb^2}{3}\right)^{-3/2} \exp\left(-\frac{3R^2}{2Nb^2}\right)$$

equivalent to a RW distribution

In spherical coordinates it can be written as:  $here |\dot{R}| = R$ 

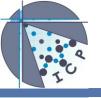
$$P_{3D}(R,N)4\pi R^2 dR = 4\pi \left(\frac{2\pi Nb^2}{3}\right)^{-3/2} \exp\left(-\frac{3R^2}{2Nb^2}\right) R^2 dR$$





Be aware:

For  $R > R_{max}$  the Gaussian approximation predicts a finite probability, which is unphysical



# Free Energy of an Ideal Chain

Entropy  $S = k_B \ln \Omega$ 

 $\Omega(N, \vec{R})$ : number of conformations of a freely jointed chain with N monomers and  $\vec{R}$ 

$$\hookrightarrow P_{3D}(N,\vec{R}) = \frac{\Omega(N,\vec{R})}{\int \Omega(N,\vec{R}) dR}$$

$$\hookrightarrow S(N,\vec{R}) = k_B \ln P_{3D}(N,\vec{R}) + k_B \ln \left[ \int \Omega(N,\vec{R}) \right]$$

$$= -\frac{3}{2} k_B \frac{R^2}{Nb^2} + \frac{3}{2} k_B \ln \left( \frac{3}{2\pi Nb^2} \right) + k_B \ln \left[ \int \Omega(N,\vec{R}) dR \right]$$

$$= -\frac{3}{2} k_B \frac{R^2}{Nb^2} + S(N,0)$$

 $\hookrightarrow \max(S(N, \vec{R})) = S(N, 0)$  Helmholtz-Free energy:

$$F(N,\vec{R}) = U(N,\vec{R}) - TS(N,\vec{R}) = \frac{3}{2}k_BT\frac{R^2}{Nb^2} + F(N,0)$$
  
ideal chain has no long range  $U(N,0) - TS(N,0)$   
interaction, independent of  $\vec{R}$ 



# Free Energy of an Ideal Chain

Ideal chain free energy increases  $\sim \vec{R}^2$ 

Hooke's law of a spring!

To stretch the chain ends by a distance  $R_x$  in x-direction requires a force

$$f_x = \frac{\partial F(N,R_x)}{\partial x} = \frac{3k_BT}{Nb^2}R_x$$
, or in general  $\vec{f} = \frac{3k_BT}{Nb^2}\vec{R}$ 

$$\vec{f} = \frac{3k_BT}{Nb^2}\vec{R}$$

entropic spring constant

For large N, large b, lower T a polymer becomes easier to stretch **Entropic elasticity** 

Metals and ceramics become soft as T is raised energetic elasticity

Rubber contracts if one raises T [or heats up when one extends it!]



### www.youtube.com/watch?v=GUY1w2WX2tc



$$F(N, \vec{R}) = \frac{3}{2} K_B T \frac{R^2}{Nb^2}$$



# Scaling of the Polymer Extension

For polymers different scaling regimes exist in the limit of large N:

 $R \sim N^{v}$ 

where v is called the Flory exponent

Ideal (RW, Gaussian) chain or  $\Theta$  – solvent: v = 1/2

SAW, real chain, polymer in good solvent: v = 0.63...

(Flory v = 3/5)

Polymer in poor solvent: v = 1/3

Polyelectrolyte: v = 1



# Flory Scaling Theory (Real Chains)

In reality, chains can not intersect, have excluded volume. Self-Avoiding Walk (SAW)

The energy of excluded volume interaction is  $k_BT$  per exclusion  $v\frac{N}{R^3}$ , for N monomers we have  $F_{Rep} \sim k_BTv\frac{N^2}{R^3}$  (second virial interaction)

Minimization:

d	$ u^{Flory}$	$v_{exact}$
1	1	1
2	$\frac{3}{4}$	$\frac{3}{4}$
3	$\frac{3}{5}$	0.588
4	$\frac{1}{2}$	$\frac{1}{2}$

 $d \ge 4$  no correction in chain statistics due to excluded volume "upper critical dimension"



# Blobology (left out more or less)

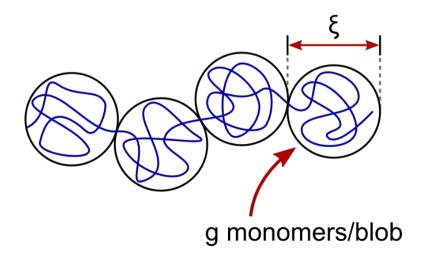
### deGennes scaling theory...

P.G. deGennes, Scaling Concepts in Polymer Physics, Cornell University Press, Ithaca (1979).

Sufficiently small parts of the chain are unperturbed (blobs)

Chain ~ sequence of blobs

Yielding simple power law scaling relations





# Hydrodynamics of polymers

Hydrodynamic radius of a polymer

$$\langle \frac{1}{R_H} \rangle = \frac{1}{N} \sum_{i \neq j} \langle \frac{1}{|\vec{r}_i - \vec{r}_j|} \rangle$$

Einstein relation 
$$D_0=\frac{k_BT}{\Gamma_0}$$
 Stokes  $\Gamma_0=6\pi\eta R$  Stokes Einstein  $D=\frac{k_BT}{6\pi nR}$ 

$$\Gamma_0 = 6\pi \eta R$$

Rouse dynamics

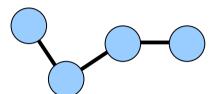
Single monomer 
$$\Gamma_0$$
 
$$\Gamma_R(N) = \sum_i^N \Gamma_i = N \Gamma_0 \qquad D_{Rouse}(N) = \frac{k_b T}{\Gamma_0} N^{-1}$$

$$\Gamma_Z(N)\sim 6\pi\eta R(N)\sim 6\pi\eta R^{
u}$$
  $D_{Zimm}=rac{k_BT}{\Gamma_Z(N)}\sim rac{k_BT}{6\pi\eta b}N^{-
u}$  Chain as a coil

$$D_{KZ}(N) = \frac{D_0}{N} + \frac{k_B T}{6\pi \eta} \langle \frac{1}{R_H} \rangle$$

# Ex: Gaussian Polymer in a ⊕-Solvent

- Conformational properties of a Gaussian polymer in a Θ-solvent are that of a random walk
- Basis for bead-spring model of a polymer!



• Use a harmonic potential for the bonds:

$$V_{\rm h}(r) = \frac{k}{2} (r - r_0)^2$$

We can compute the partition function exactly

$$H_0 = \frac{1}{2} \underbrace{\frac{3k_B T}{b^2}}_{k} \sum_{i=0}^{N-1} |\vec{r_i} - \vec{r_{i+1}}|^2$$

 Random walk and bead-spring model generate the same partition function!

# Polymer Chains in Good Solvent

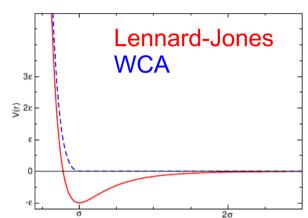
- $\Theta$ -solvent is a special case!
- Solvents are good or poor w.r. to the polymer
- Good solvent can be modeled via a repulsive potential
  - Use the repulsive part of Lennard-Jones (aka Weeks-Chandler-Anderson)

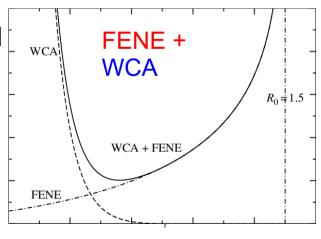
$$V_{\text{WCA}}(r) = \begin{cases} V_{\text{LJ}}(r) + \varepsilon &, \text{if } r < 2^{1/6}\sigma \\ 0 &, \text{otherwise} \end{cases}$$



$$V_{FENE}(r) = -\frac{1}{2}kR_0^2 \ln(1 - \frac{r}{R_0})$$

- Has a maximal extension/compression
- Sufficient to avoid bond crosssing



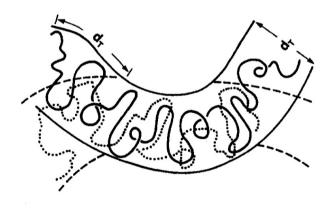




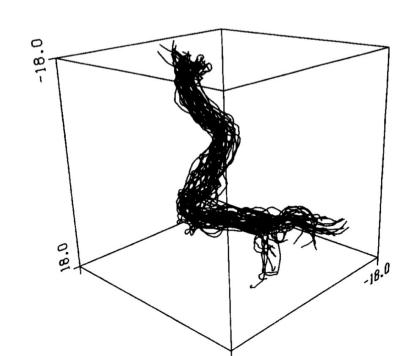
### Kremer-Grest Model

K. Kremer, G. Grest, J. Chem. Phys. 92, 5057 (1990)

- The standard model for polymer melts!
- Langevin-MD with a bead-spring model: FENE bonds plus WCA potential for beads with Kremer-Grest parameters:  $R_0 = 1.5\sigma$  and  $k = 30\epsilon/\sigma$
- Very efficient. Sizes can be pushed up to a few hundred chains of 300-400 beads

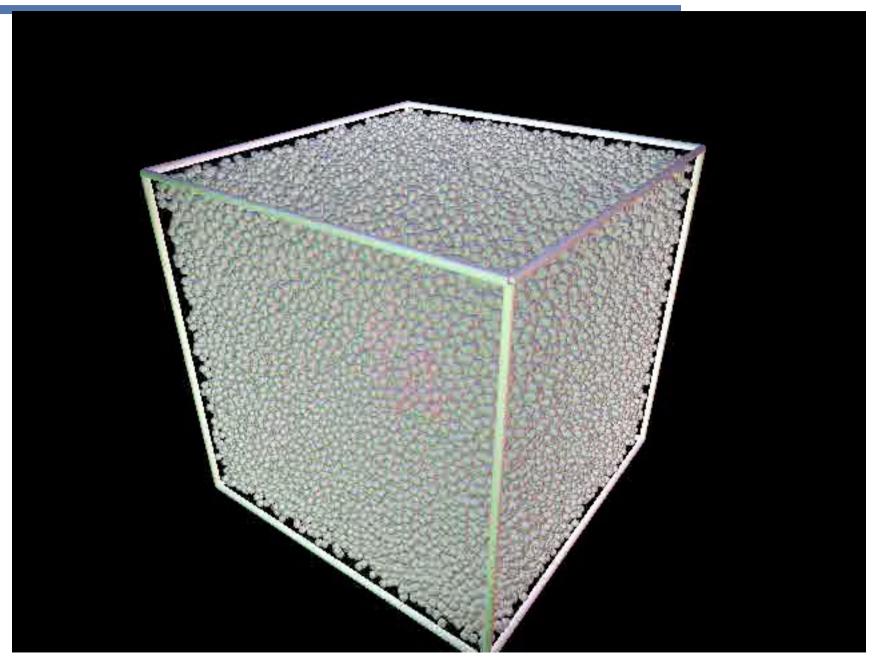


Idea of Reptation





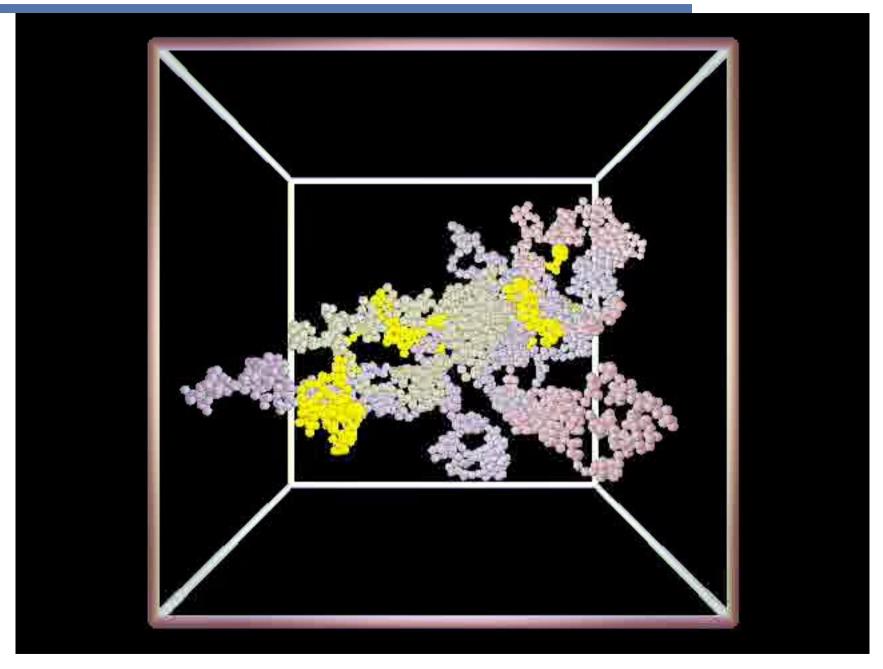
# Kremer-Grest Polymer Melt



Ralf Everaers, et al. Science 303, 823 (2004); DOI: 10.1126/science.1091215



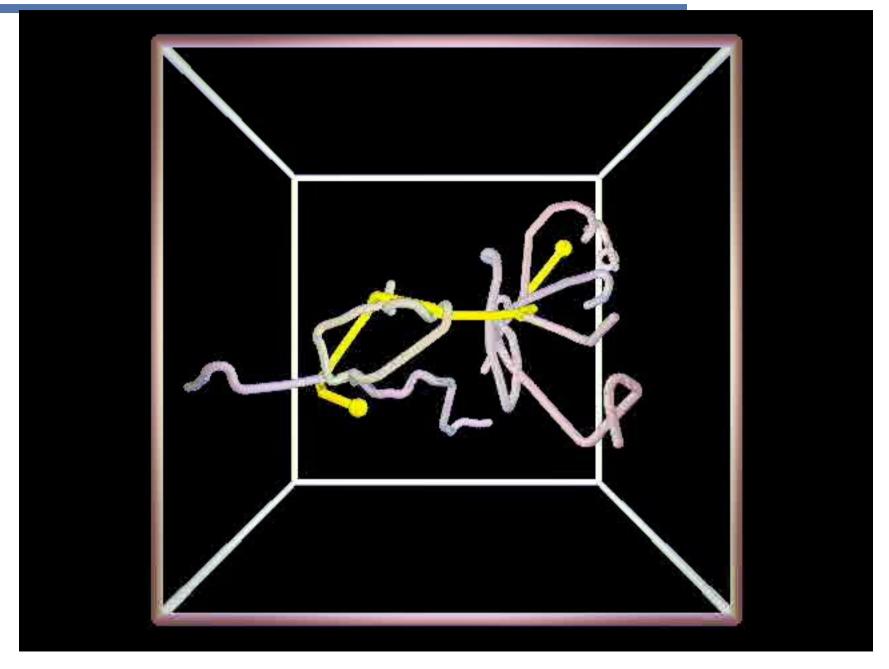
# Primitive Path Analysis ->



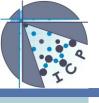
Ralf Everaers, et al. Science 303, 823 (2004); DOI: 10.1126/science.1091215



# Entanglements

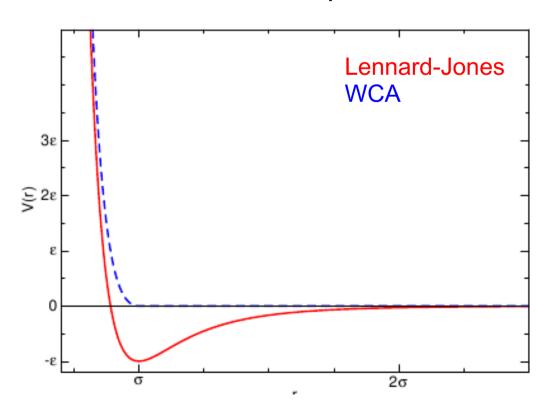


Ralf Everaers, et al. Science 303, 823 (2004); DOI: 10.1126/science.1091215



# Polymer Chains in Poor Solvent

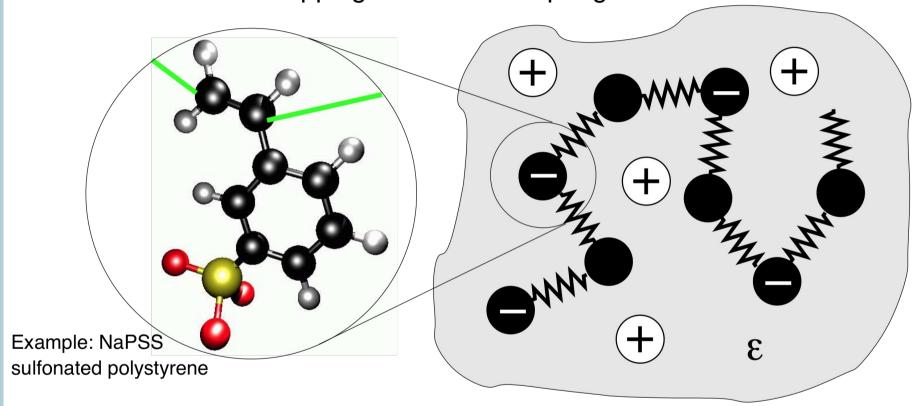
- Poor solvent can be modeled via a full Lennard-Jones potential
- Polymer monomers experience an attraction, since they want to minimize contact with solvent
- the quality of the solvent can be changed by varying the attraction via the interaction parameter  $\epsilon$  and the cut-off





# **Charged Polymers**

Mapping onto a bead-spring model



monomers, ions beads with charge fraction f bond potential nonlinear springs solvent dielectric background  $\epsilon$  effective bead-bead interaction



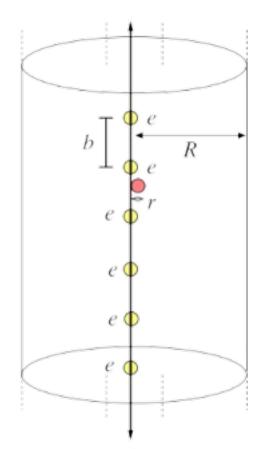
# Polymer simplification



complex interaction: ion distribution → polymer conformation stiff, stretched polymer conformation → uniformly charged rod.



# Onsager Argument for Condensation



$$\lambda = e_0/b$$
  $\ell_{\rm B} := e_0^2/4\pi\varepsilon k_{\rm B}T$   $\phi(r) \approx \frac{\lambda}{2\pi\varepsilon} \ln(r)$ 

question:  $\Delta F = \Delta E - k_{\rm B} T \Delta S$  ?

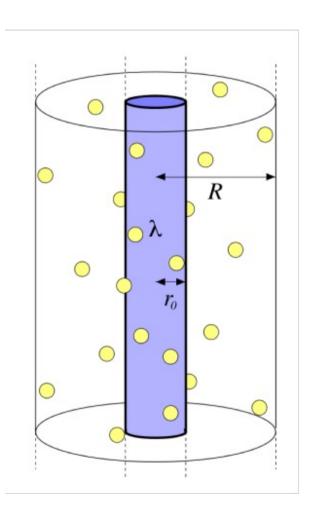
$$\Delta E \sim e_o \frac{\lambda}{2\pi\varepsilon} \ln \frac{R}{r} \quad \Delta S \sim \ln \frac{V_R}{V_r} \sim 2 \ln \frac{R}{r}$$

$$\Longrightarrow \Delta F = \left(\frac{\ell_{\rm B}}{b} - 1\right) 2k_{\rm B}T \ln \frac{R}{r}$$

 $\xi:=\tfrac{\ell_{\mathrm{B}}}{b}<1, \text{ entropy dominated, } \xi:=\tfrac{\ell_{\mathrm{B}}}{b}>1, \text{ energy dominated}$   $\Longrightarrow \text{The charged plane is energy dominated}$   $\Longrightarrow \text{The charged sphere is entropy dominated}$ 



# PB for a cylindrical cell model



Bjerrum length Manning parameter Reduced potential

$$\ell_{\mathrm{B}} := e_0^2/4\varepsilon k_{\mathrm{B}}T$$

$$\xi := \lambda \ell_{\mathrm{B}}/e_0$$

$$y(r) := e_0 \Psi(r)/k_{\mathrm{B}}T$$

$$y'' + \frac{1}{r}y' = 4\pi \ell_{\rm B} n(r) n(r) = n(R) e^{y(r)} ; y'(r_0) = -2\xi/r_0 y'(R) = 0$$

$$y(r) = -2\ln\left\{\frac{r}{R}\sqrt{1+\gamma^{-2}}\cos\left(\gamma\ln\frac{r}{R_{\rm M}}\right)\right\}$$

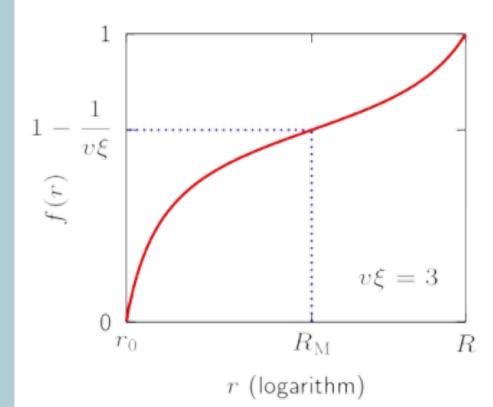
where the integration constants  $\gamma$  and  $R_{\rm M}$  are obtained from the boundary conditions



# Counterion Condensation

the fraction of counterions within a distance  $r \in [r_0, R]$  is given

$$f(r) = 1 - \frac{1}{\xi} + \frac{\gamma}{\xi} \tan\left(\gamma \ln \frac{r}{R_{\rm M}}\right)$$



Manning condensation at  $\xi > 1$ :

$$f < 1 - \frac{1}{\xi} \iff \lim_{R \to \infty} r(f) < \infty$$

Inflection point criterium:

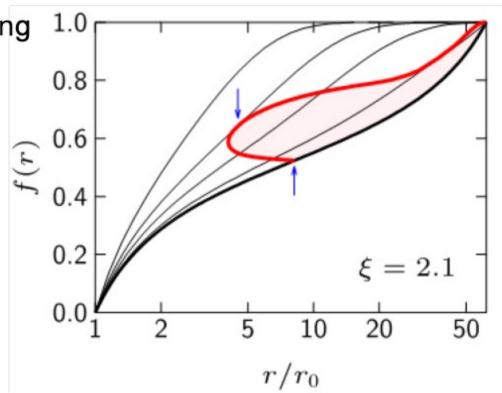
$$\frac{\mathrm{d}^2 f}{\mathrm{d}(\ln r)^2} \bigg|_{r=R_{\mathrm{M}}} = 0 \quad \Rightarrow \quad R_{\mathrm{M}}$$



# Condensation with Added Salt

 Inflection points of f(r) → Manning radius & fraction

- Ion fraction → charge fraction
- More salt → more screening: condensed layer contracts
- λ<sub>D</sub><R: new inflection points for increasing concentration</li>
- $\lambda_D < R_M$ : no inflection points (screening dominates)

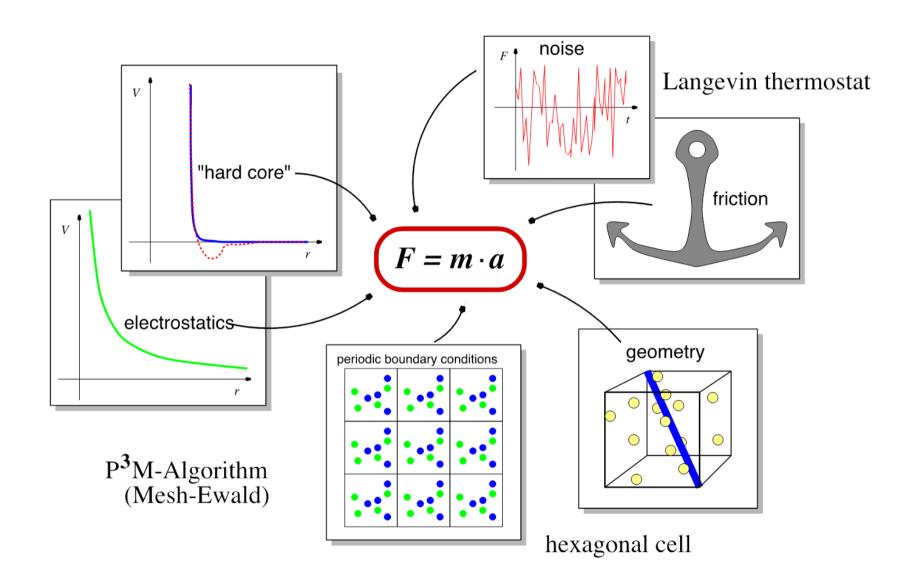


Exchange of the relevant length-scale:  $R_{\rm M} \to \lambda_{\rm D}$ .

If screening dominates the concept of condensation looses its meaning!

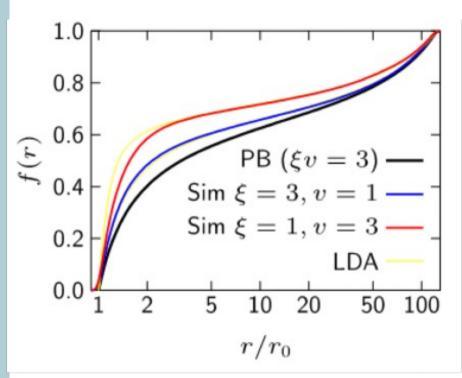


# Simulations...





## Manning Parameter versus Valence



- Counterion condensation is stronger than in Poisson-Boltzmann theory.
- Product ξv is no longer universal.
- Discrepancy increases with valence.

 Local density approximation(LDA): local correction to the PB free energy functional (~first correction on correlation effects)

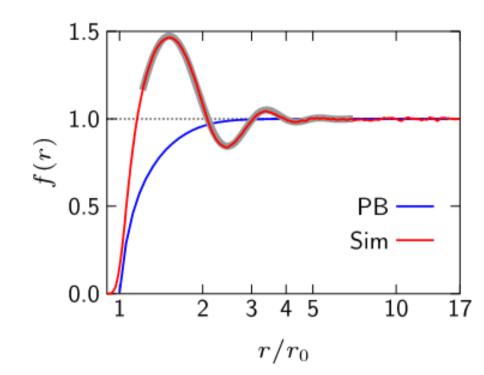
Poisson-Boltzmann theory neglects correlations; these enhance counterion condensation, especially for multivalent counterions.



# Overcharging for Multivalent Salt

$$\xi = 4$$
; 2:2-Salt;  $\bar{n} = 2.1 \times 10^{-2} \sigma^{-3}$ 

- The rod charge gets repeatedly overcompensated.
- Reversed charged layers.
- Charge oscillations are exponentially damped.



#### PB fails if:

- 1) Strong electrostatic interactions (large  $\lambda$ )
- 2) Multivalent ions (correlation effects)
- 3) High density (excluded volume becomes important)

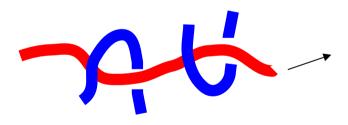


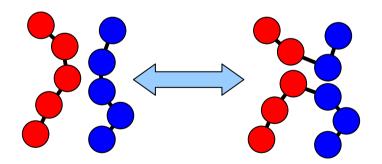
# MC moves in molecular simulations

- Single particle moves ensure irreducibility
- Other moves can be invented to faster sample the possible states
- Examples for polymer simulations: pivot, double pivot, or...

Reptation moves

Crossover moves





# Summary

- Basic polymer chemistry facts
- Basic polymer physics concepts
- Theoretical description of polymers
- Polymeric diversities and statistics
- How to simulate polymers
- Concept of counterion condensation



# Good text books on polymers

- Gert Strobl, Condensed Matter Physics,
   Springer, 2004
- M. Rubinstein, R. Colby, *Polymer Physics*,
   Oxford University Press, 2003
- Richard A.L. Jones, Soft Condensed Matter, Oxford Master Series in Condensed Matter Physics, Vol. 6, 2002