

### PRACTICAL WORK - SOFT MATTER

Numerical simulations of ideal chain model of polymer

Dr. Adrien Nicolaï & Pr. Patrick Senet



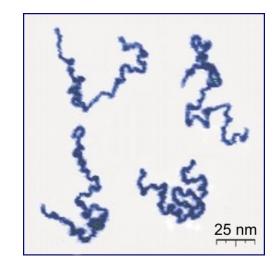
### Presentation

Theoretical lecture: Pr. SENET

**Grade**: 50% theoretical exam + 50% practical work

Practical work: Dr. NICOLAÏ

2h Exercise + 4h Practical



**Location**: computer room D102

**GRADE**: Report of 4 pages MAX about practical work - template of research paper

**DEADLINE:** Friday January 12th, 2024 - 6 PM











# Introduction

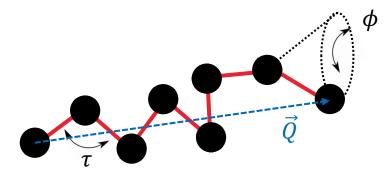
### Numerical simulations of ideal chain model of polymer using PYTHON

The **freely-jointed chain** (FJC) model consist of a chain of bonds: the orientation of the different bonds is completely uncorrelated and no direction is preferred.

**2 parameters: number of bonds** N and bond length b (N + 1 monomers; no exlcuded volume = "phantom" chains)

• One measure of extent:  $\langle Q^2 \rangle = Nb^2 + \sum_{i \neq j}^N b^2 \langle cos\theta_{ij} \rangle$ 

There is no correlation between the segments: angle between 2 bond vectors  $\theta_{ij}$  (=  $180 - \tau_{ij}$ ) can have all values ->  $\langle cos\theta_{ij} \rangle = 0$ 



i.e. the bond angle  $\tau$  [0,180] and torsion angle  $\phi$  [0,360] can have any value

Mean square **end-to-end distance**  $\langle Q^2 \rangle = Nb^2$ 

see chapter 2 of theoretical lectures for demonstration











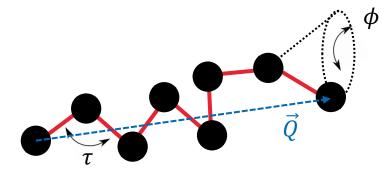
# Introduction

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i.e. the bond angle  $\tau$  [0,180] and torsion angle  $\phi$  [0,360] can have any value

- Probability distribution **end-to-end distance** 
$$P(\vec{Q}) = \left(\frac{3}{2\pi Nb^2}\right)^{3/2} exp\left(-\frac{3Q^2}{2Nb^2}\right)$$

see chapter 2 of theoretical lectures for demonstration











# Introduction

### Numerical simulations of ideal chain model of polymer using PYTHON

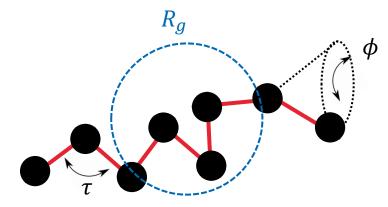
• Another measure of extent  $R_g$ : radius of gyration (accounts for the position of all monomers)

$$R_g^2 = \frac{1}{N} \sum_{i=0}^{N} (\vec{R}_i - \vec{R}_{cm})^2$$

 $\vec{R}_i$ : position of monomer i

$$\vec{R}_{cm} = \frac{1}{N} \sum_{i=0}^{N} \vec{R}_{i}$$
 : position of center of mass

Mean square radius of gyration  $\langle R_g^2 \rangle = \frac{Nb^2}{6} (N \to \infty)$ 



i.e. the bond angle  $\tau$  [0,180] and torsion angle  $\phi$  [0,360] can have any value

see chapter 2 of theoretical lectures for demonstration







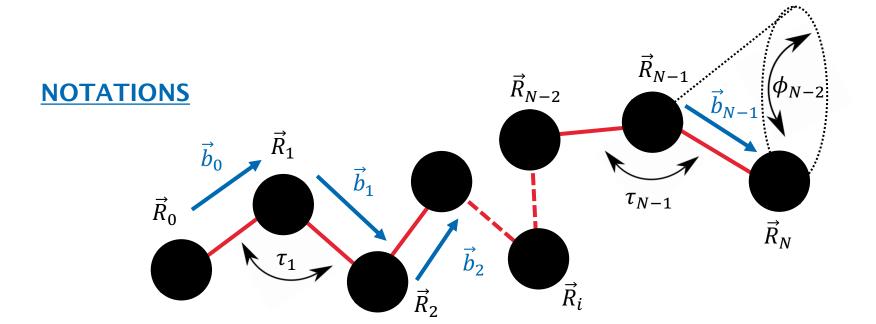




# Simulations

### Numerical simulations of ideal chain model of polymer using PYTHON

### Modelling of polymer conformation using FJC model



N+1 monomers  $\vec{R}$ 

N bonds  $\vec{b}$ 

N-1 bond angles  $\tau$ 

N-2 dihedral angles  $\phi$ 











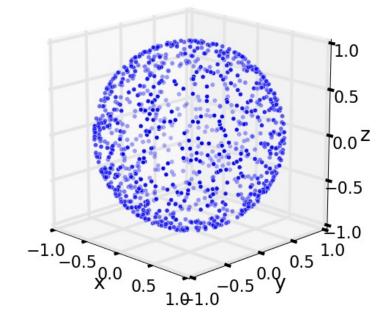
# Algorithm

### Numerical simulations of ideal chain model of polymer using PYTHON

- Define parameters: b, N and T
- For t = 1 -> T
  - Generate N bond vectors  $\vec{b}$

generate uniformly distributed numbers in the cube  $[-1,1]^3$  and ignore any points that are further than a unit distance r from the origin. This will ensure a uniform distribution in the region  $r \le 1$ . Next, normalize each random vector to have unit norm so that the vector retains its direction but is extended to the sphere of unit radius. As each vector within the region  $r \le 1$  has a random direction, these points will be uniformly distributed on a sphere of radius 1.





OUTPUT: xyz trajectory file (<a href="https://en.wikipedia.org/wiki/XYZ\_file\_format">https://en.wikipedia.org/wiki/XYZ\_file\_format</a>)









# Python script

See script\_FJC\_simulation\_STUDENT.ipynb

Jupyter Notebook











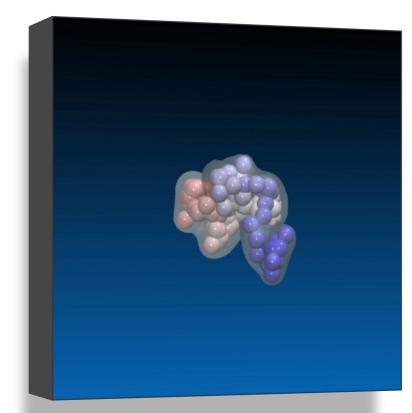


# Exercise

### Numerical simulations of ideal chain model of polymer using PYTHON

### Exercise:

- 1) Generate T=1000 conformations of the polymer (N=100)
- 2) Visualize the structures using VMD software
- 3) Compute and plot time series of METRICS Q &  $R_g$
- 4) Compute  $<Q^2> \& <R_g^2>$
- 5) Compare numerically with theoretical values







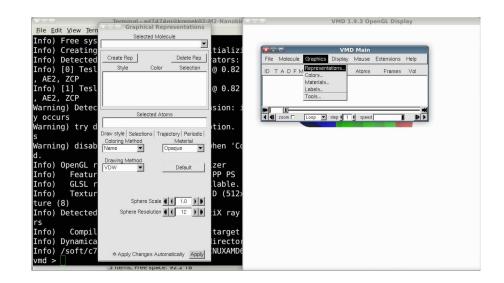




## Visualization

#### **VMD**

- 1. Load the file *polymer.xyz* (File -> New Molecule -> Browse...-> Load)
- 2. Go to Graphics -> Representation
- 3. Select Coloring Method = Index and Drawing Method = VDW
- 4. Select Material Glossy
- 5. Change Sphere Resolution to 50
- Go to File -> Render...
- 7. Select Tachyon (internal, in-memory rendering)
- 8. Define filename and click on Start Rendering to generate an image of the screen













### **GOAL**: verified numerically the 4 following theoretical results

- Mean square end-to-end distance  $\langle Q^2\rangle=Nb^2$  for  $N=10\dots 1000$  - Mean square radius of gyration  $\left\langle R_g^2\right\rangle=\frac{Nb^2}{6}(N\to\infty)$ 

- Probability distribution end-to-end distance  $P(Q) = 4\pi Q^2 \left(\frac{3}{2\pi Nb^2}\right)^{3/2} exp\left(-\frac{3Q^2}{2Nb^2}\right)$  for N = 100

- Singular behavior  $P(Q) = \frac{Q}{2h^2}$  for N = 2

+ study of the influence of T + comparison with theory (estimation of errors)







### Numerical simulations of ideal chain model of polymer using PYTHON

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- Structure factor 
$$I(k) = \sum_{i=0}^{N} \sum_{j=0}^{N} \left\langle \frac{\sin(k \|\overrightarrow{R_i} - \overrightarrow{R_j}\|)}{k \|\overrightarrow{R_i} - \overrightarrow{R_j}\|} \right\rangle$$

for N = 100

- Comparison with Guinier approximation

$$I(k) = (N+1)^{2} \left[ 1 - \frac{(kR_g)^{2}}{3} \right]$$

+ estimation of Rg from I(k) + error





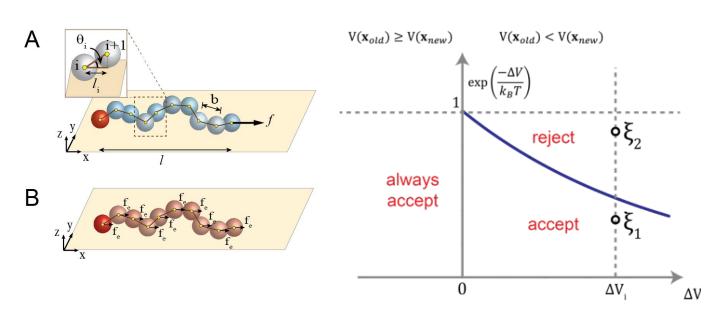






#### TO GO FURTHER:

Consider a force F along the cartesian X direction and a temperature T. Compute the force-extension curve as a function of the force F applied using a Metropolis Monte-Carlo algorithm.



#### **Algorithm**

- Create a structure of FJC polymer (t=0)
- Define a force along x: F = [Fx,0,0]
- Compute potential energy  $V = -\vec{F} \cdot \vec{Q}$
- Modify randomly one bond vector
- Compute the new potential energy
- Use Metropolis MC to accept or reject the move
- Iterate over T conformations
- Compute Q(T) = extension





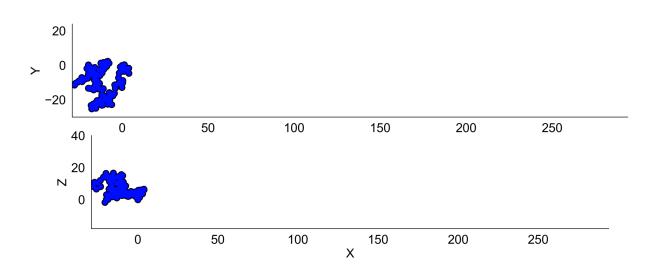






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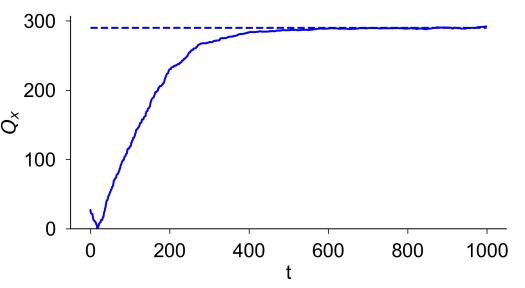


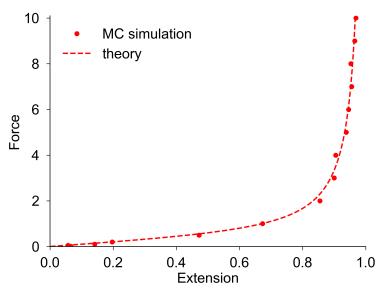




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$$|\vec{Q}.\vec{u_x}| = Nb \left[ \coth(\alpha) - \frac{1}{\alpha} \right], \alpha = \frac{Fb}{k_B T}$$



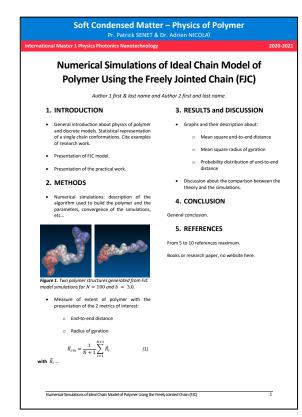




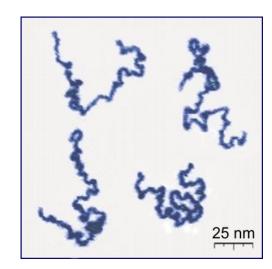




- Write a report following the template provided to you as a research paper
  - INTRODUCTION
  - METHODS
  - RESULTS and DISCUSSION
  - CONCLUSION
  - REFERENCES



# VERY STRICT INSTRUCTIONS ABOUT CONTENTS AND FORMATTING!















# **END**

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