

# Understanding the Mechanical Behaviour of Glassy Amorphous Polymers through Molecular Dynamics Simulations

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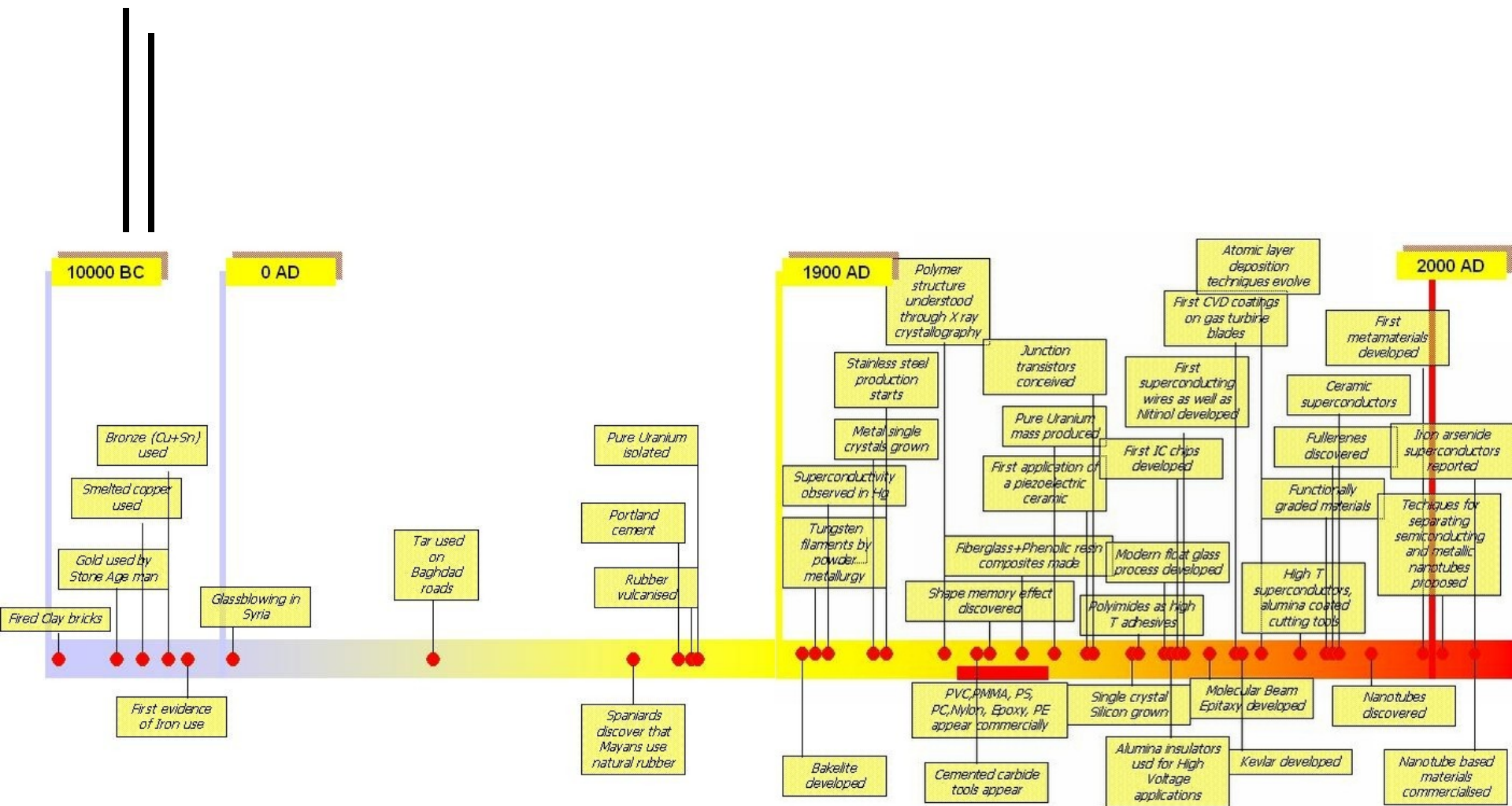
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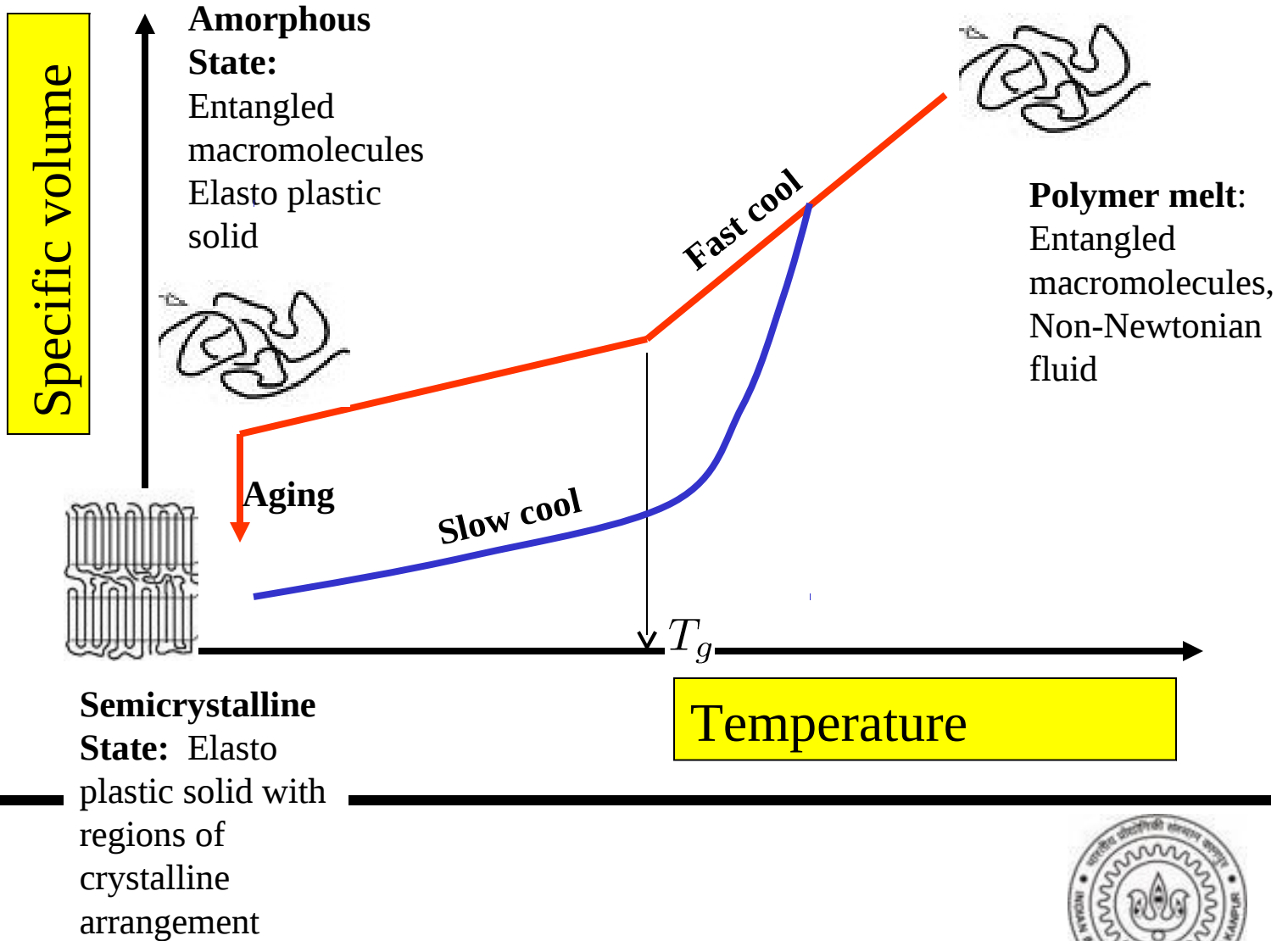
*Kanpur 208016*

Has he walked into the wrong classroom?





# What are glassy amorphous polymers?

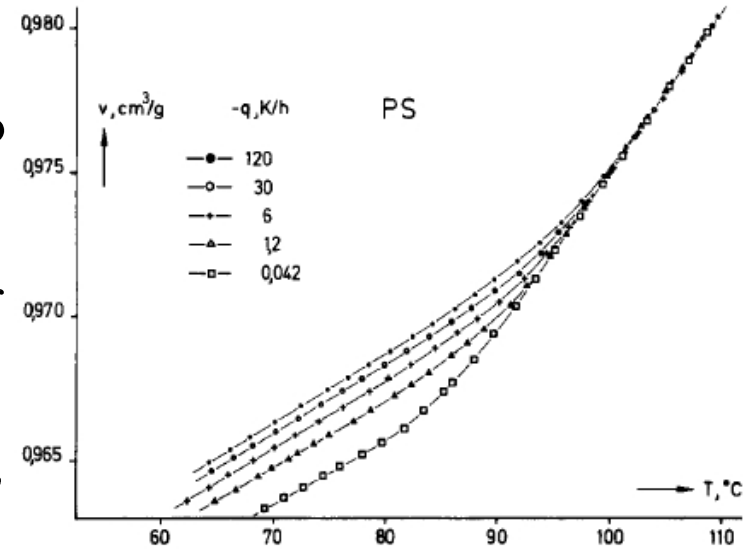


To give you an idea of the numbers involved...

For polystyrene:

1. Typical values of  $T_g$  lie between 85.8 to 95.7 °C
2. Cooling rates between 0.0042 to 120 K/hour yield amorphous structures.

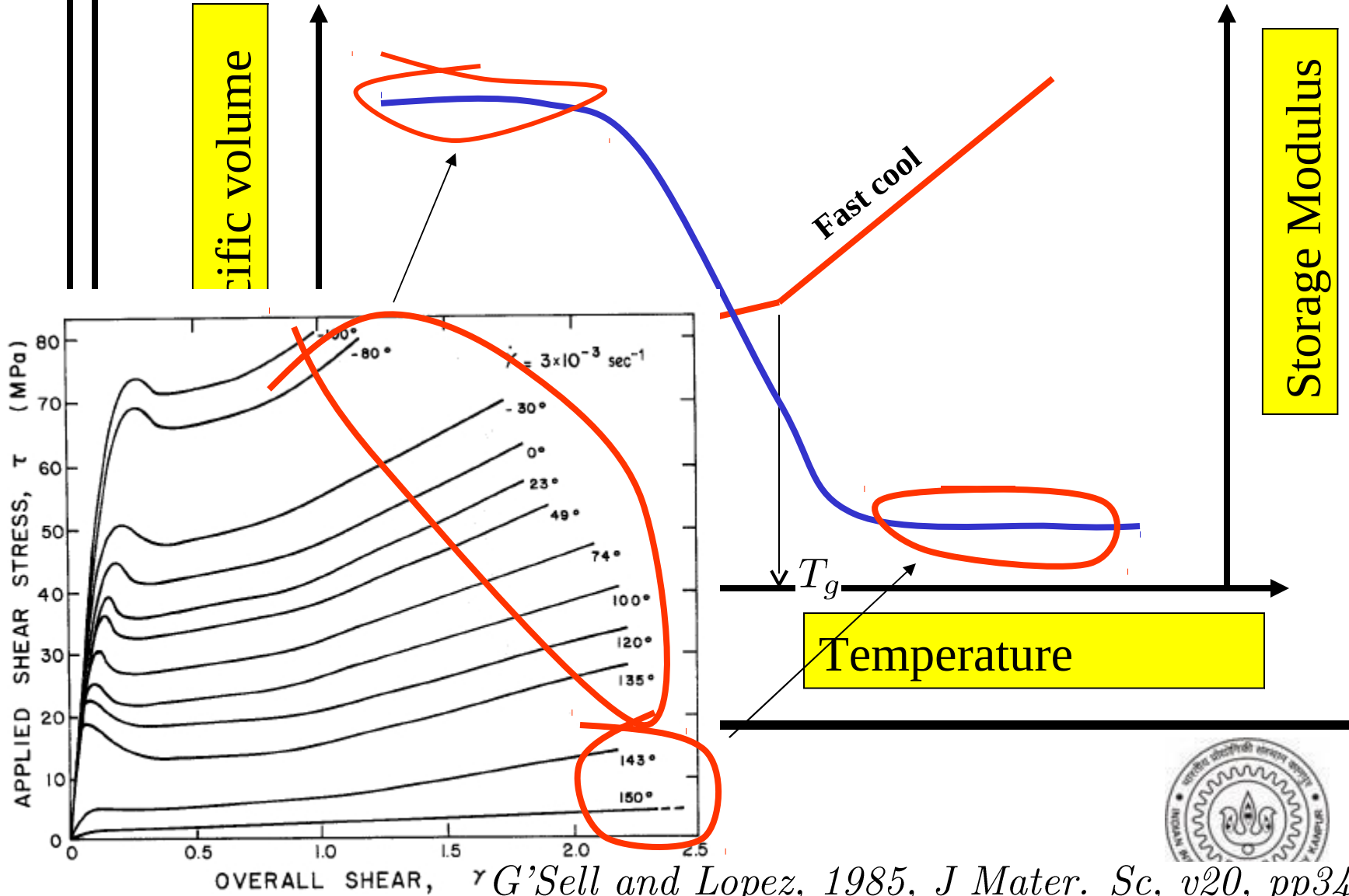
*Greiner and Schwarzl, 1984, Rheologica Acta, v23, p378*



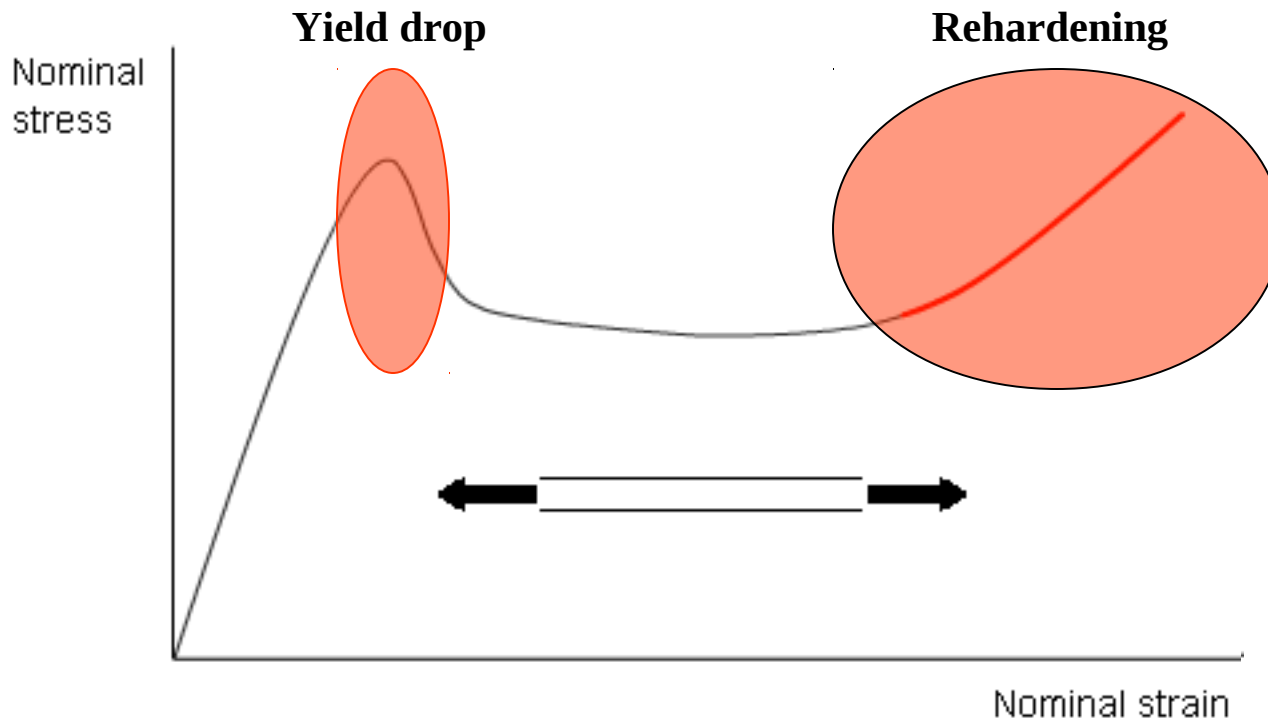
| Polymer | $T_g$    |
|---------|----------|
| PS      | 95.7 °C  |
| PMMA    | 103.7 °C |
| PVC     | 71.7 °C  |
| PC      | 141.3 °C |



# Glassy polymers have much superior mechanical properties



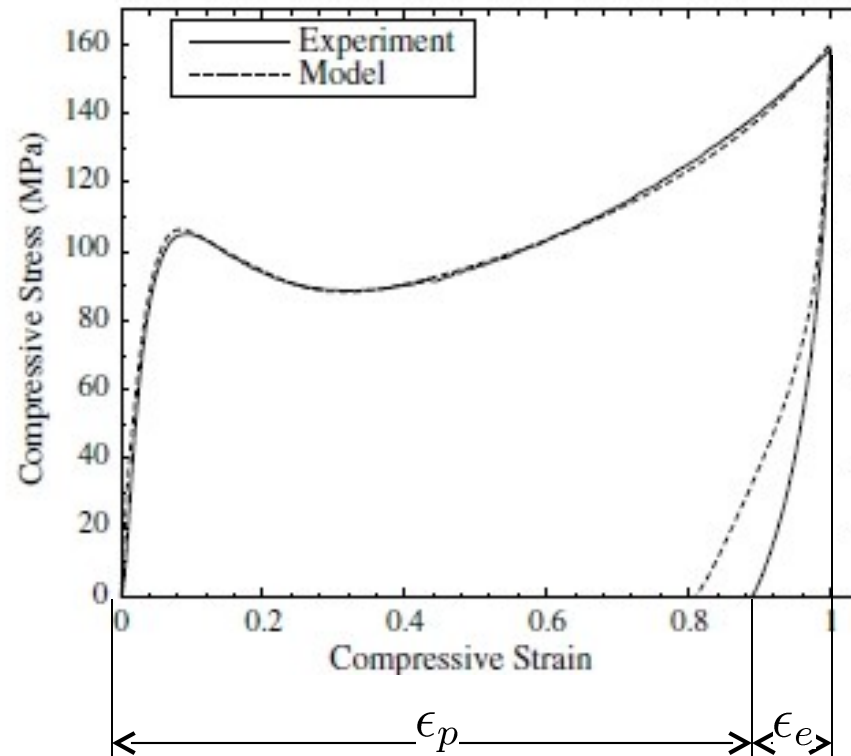
The nature of the stress strain curve has enormous technological consequences



The stress strain curve gives amorphous polymers their *formability*



## Glassy polymers can undergo large plastic deformation

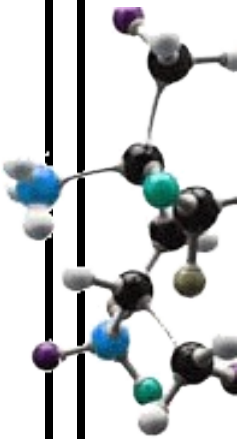
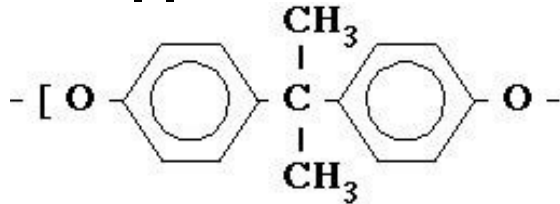
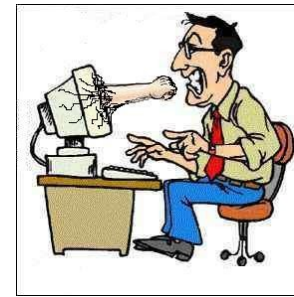


*Anand and Ames, 2006, Int J Plasticity, v22, p1123*

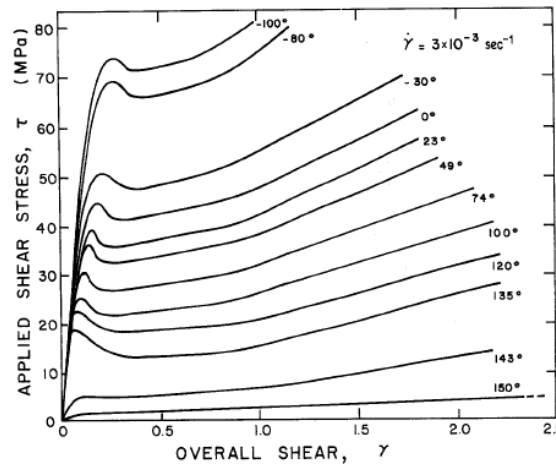
Motivation for doing MD 1:  
Understanding mechanical behaviour esp  
the origins of plasticity.



# Motivation for doing MD 2: Mechanical Property prediction



Given a macromolecular architecture

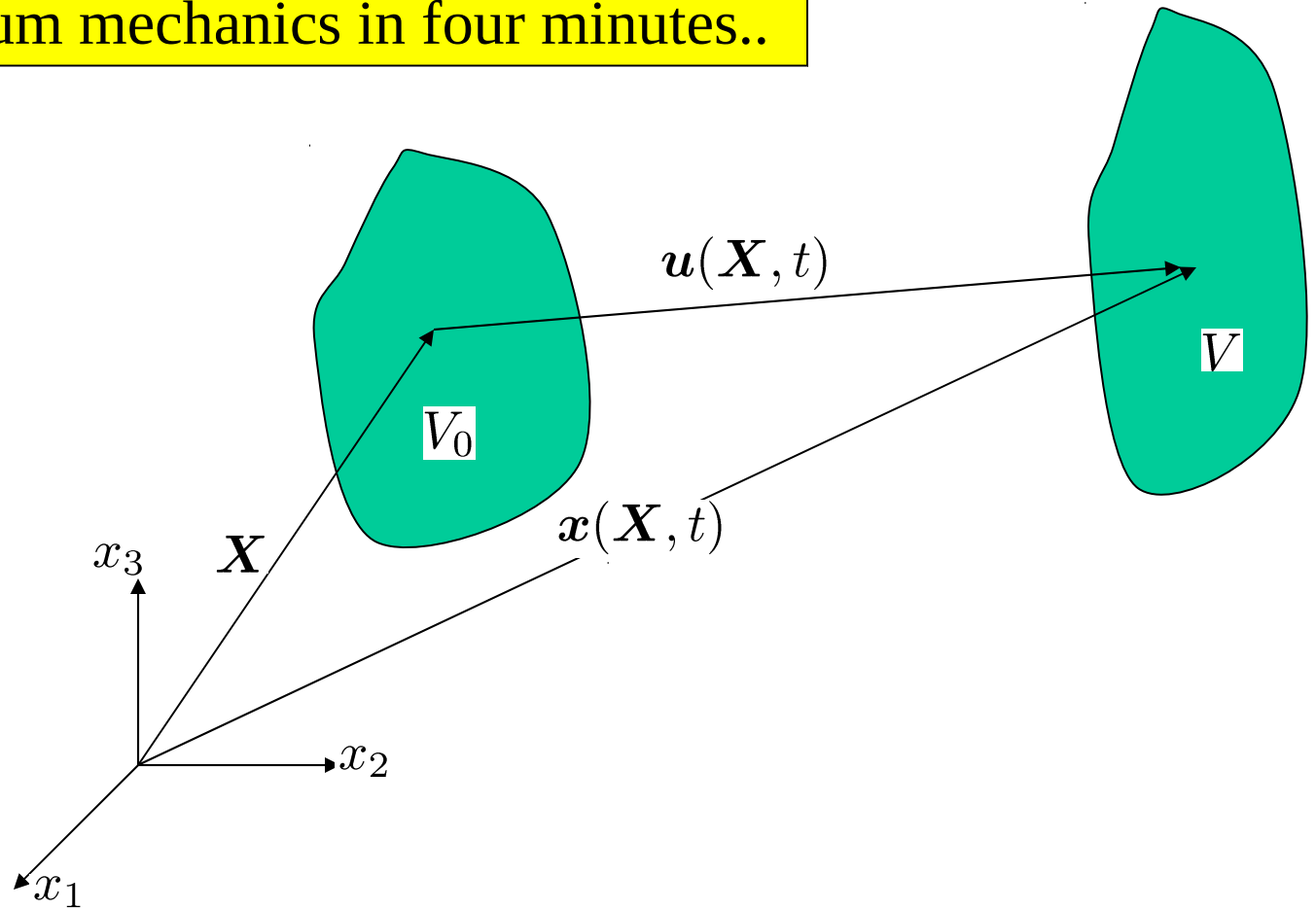


Predict mechanical behaviour in the glassy amorphous state





# Continuum mechanics in four minutes..



$$\mathbf{x}(\mathbf{X} + d\mathbf{X}) = \mathbf{x} + \mathbf{F}d\mathbf{X}$$

$\mathbf{F}$  : Deformation gradient tensor



In indicial notation

$$F_{ij} = \frac{\partial x_i}{\partial X_j}$$

Alternately, since

$$\mathbf{x} = \mathbf{X} + \mathbf{u},$$

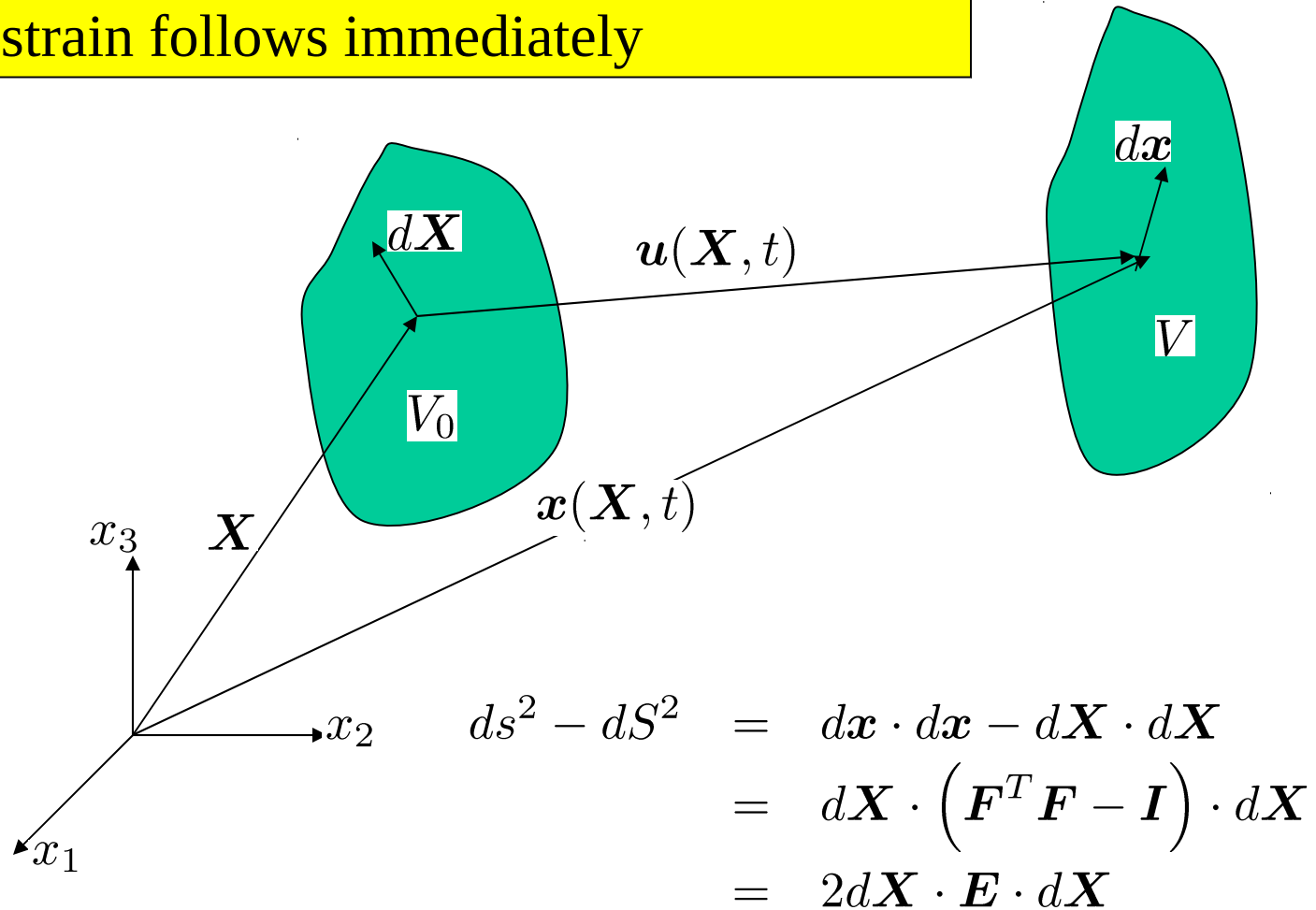
$$\mathbf{F} = \mathbf{I} + \nabla \mathbf{u}$$

or

$$F_{ij} = \delta_{ij} + u_{i,j}$$



# The concept of strain follows immediately



where

$$\mathbf{E} = \frac{1}{2} (\mathbf{F}^T \mathbf{F} - \mathbf{I}).$$

is the *Lagrangian strain tensor*

## Example: Pulling a block, uniaxial tension

The motion is given by

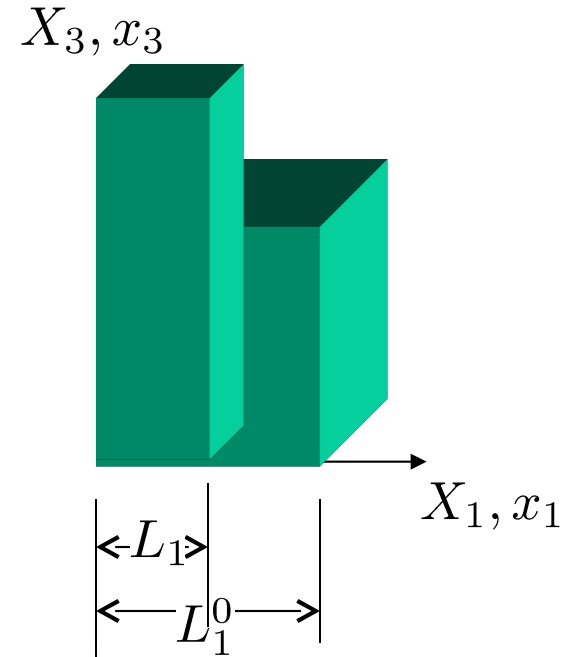
$$x_1 = \lambda_1 X_1$$

$$x_2 = \lambda_2 X_2$$

$$x_3 = \lambda_3 X_3$$

$$\mathbf{F} = \begin{pmatrix} \lambda_1 & 0 & 0 \\ 0 & \lambda_2 & 0 \\ 0 & 0 & \lambda_3 \end{pmatrix}$$

$$\mathbf{E} = \begin{pmatrix} \lambda_1^2 - 1 & 0 & 0 \\ 0 & \lambda_2^2 - 1 & 0 \\ 0 & 0 & \lambda_3^2 - 1 \end{pmatrix}$$

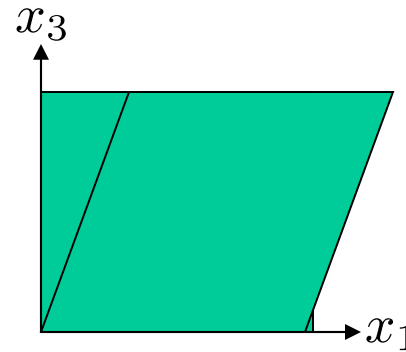


where

$$\lambda_\alpha = \frac{L_\alpha}{L_\alpha^0}$$



## Example: Shearing a block



The deformation map is

$$x_1 = X_1 + \gamma X_3$$

$$x_2 = X_2$$

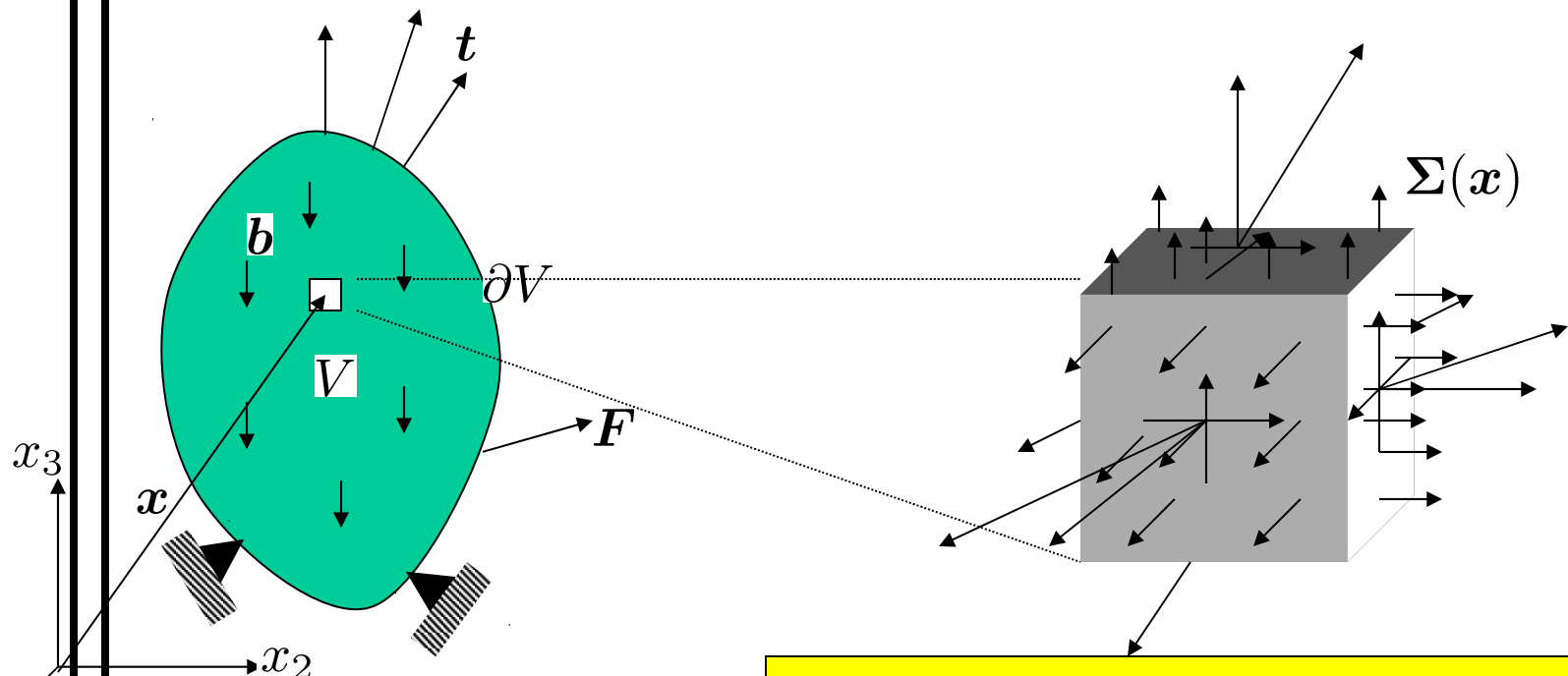
$$x_3 = X_3$$

such that

$$\mathbf{F} = \begin{pmatrix} 1 & 0 & \gamma \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{pmatrix} = \mathbf{I} + \gamma \mathbf{e}_1 \otimes \mathbf{e}_3$$



# Understanding stress



Forces due to interaction with the rest of the body

Inter-atomic forces that have been cut through can be

The components of the traction on all surfaces together constitute the stress tensor  $\Sigma$

Newton's second law: Rate of change of linear momentum equals the applied force:

$$\frac{D}{Dt} \int_V \rho \mathbf{v} dv = \int_{\partial V} \mathbf{t} da + \int_V \mathbf{b} dv$$

leads to

$$\nabla \cdot \boldsymbol{\Sigma} + \mathbf{b} = \rho \frac{D\mathbf{v}}{Dt}.$$

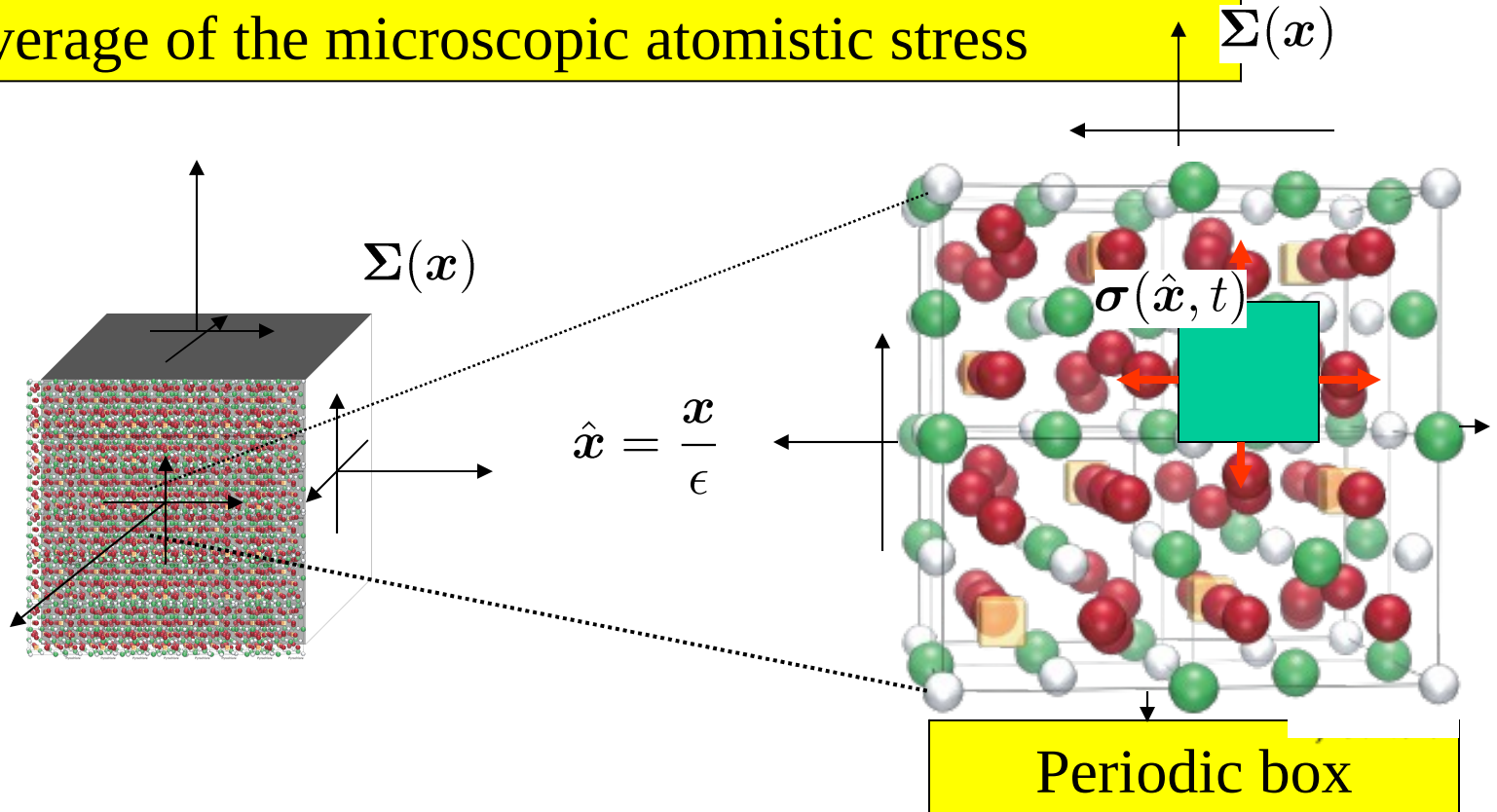
The material enters into the relation between the stress and the deformation

$$\boldsymbol{\Sigma} = \mathbf{C} : \mathbf{E},$$

Governs the constitutive response of the continuum



The macroscopic stress is the temporal and spatial average of the microscopic atomistic stress



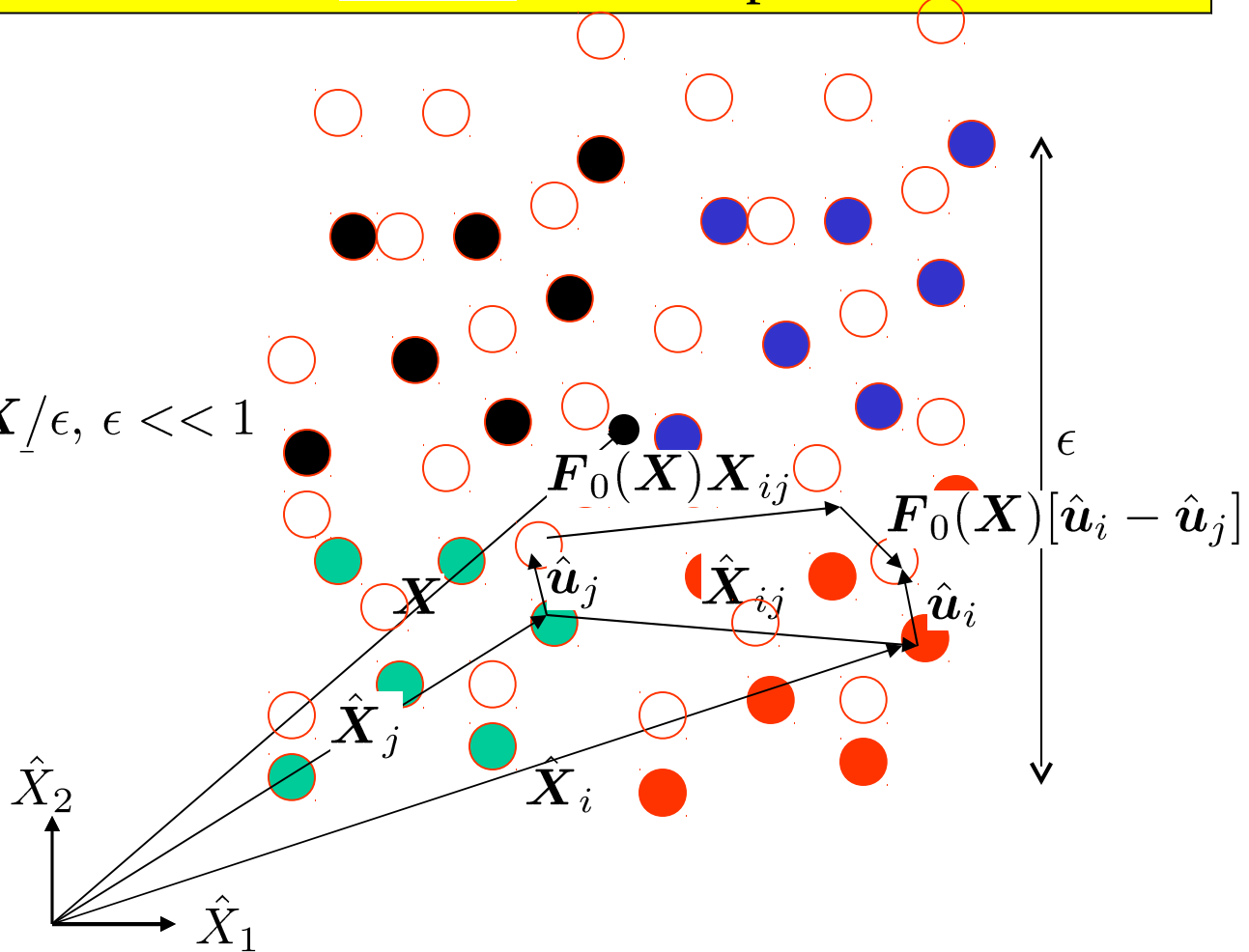
$$\Sigma(\mathbf{x}) = \frac{1}{T} \int_0^T \left\{ \frac{1}{\Omega_{pbc}} \int_{\Omega_{pbc}} \sigma(\hat{\mathbf{x}}, t) dV \right\} dt$$





What is  $\sigma(\hat{x}, t)$  ? A 0 K picture.

Zoom In  $\hat{X} = X/\epsilon, \epsilon \ll 1$



Chen and Fish, 2006, *Int J Numer Method Engng*, v67, pp189



The displacement of a point admits a multiscale expansion as:

$$\mathbf{u}(\mathbf{x}, \hat{\mathbf{x}}, t) = \mathbf{u}^0(\mathbf{x}, t) + \epsilon \mathbf{u}^1(\mathbf{x}, \hat{\mathbf{x}}, t) + \dots$$

Coarse grain displacement

At the coarse scale  $\mathbf{x}$

$$\nabla \cdot \boldsymbol{\Sigma} = \rho \ddot{\mathbf{u}},$$

At the fine scale  $\hat{\mathbf{x}} = \mathbf{x}/\epsilon$

$$\sum_{i \neq j} \mathbf{f}_{ij} = m_i \ddot{\mathbf{u}}_i.$$

Note that we have considered pairwise forces only but this restriction can be easily removed.



If the continuum deforms homogeneously,

$$\nabla \cdot \Sigma \sim \mathcal{O}(1).$$

Also,

$$\rho \sim \mathcal{O}(1).$$

and

$$\Omega_{pbc} \sim \mathcal{O}(\epsilon^3)$$

$$\frac{1}{\epsilon^3} \sum_{i \neq j} \mathbf{f}_{ij} = \rho \ddot{\mathbf{u}}_i \sim \nabla \cdot \Sigma \Rightarrow \mathbf{f}_{ij} \sim \mathcal{O}(\epsilon^3).$$

With a first order expansion of  $\mathbf{u}$  (upto order  $\epsilon$ ), and pbc, the stress measure

$$\Sigma = \frac{1}{2\Omega_{pbc}} \sum_i \sum_{j \neq i} \mathbf{f}_{ij} \otimes \mathbf{x}_{ij}.$$

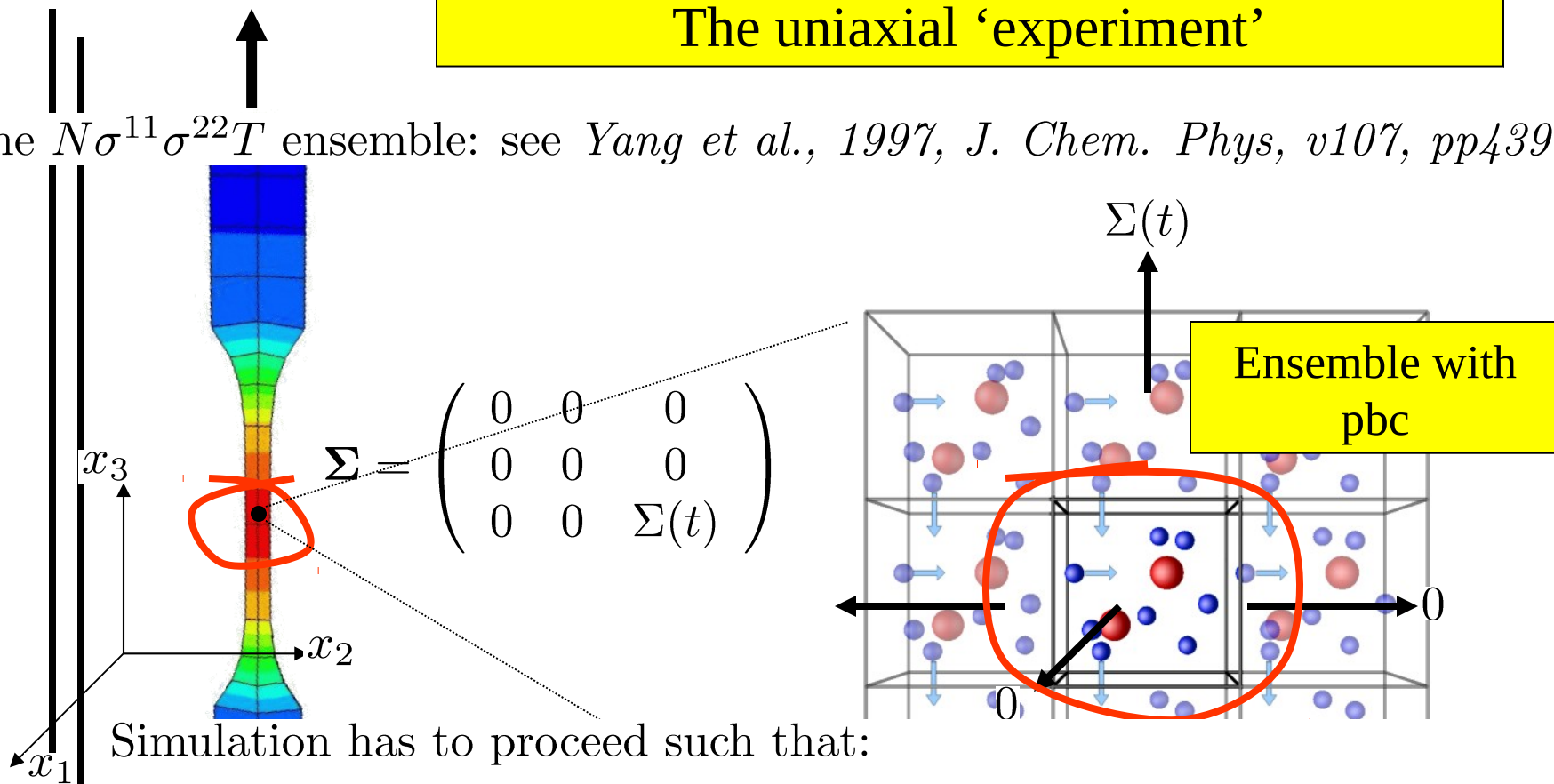
satisfies the continuum equilibrium equation

$$\nabla \cdot \Sigma - \rho \ddot{\mathbf{u}} = 0.$$



# The uniaxial 'experiment'

The  $N\sigma^{11}\sigma^{22}T$  ensemble: see *Yang et al., 1997, J. Chem. Phys, v107, pp4396*



$$\Sigma = \Sigma^{33} = \frac{1}{2\Omega_{pbc}} \sum \sum f_{ij}^3 x_{ij}^3$$

$$0 = \frac{1}{2\Omega_{pbc}} \sum \sum f_{ij}^1 x_{ij}^1 = \frac{1}{2\Omega_{pbc}} \sum \sum f_{ij}^2 x_{ij}^2$$

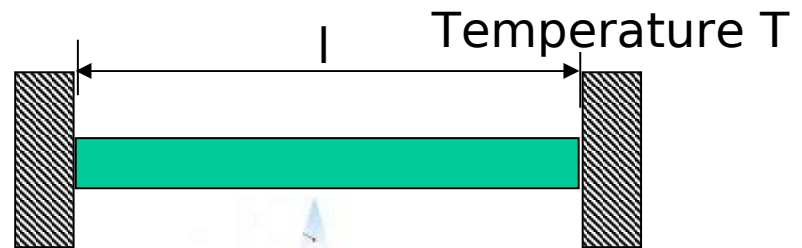
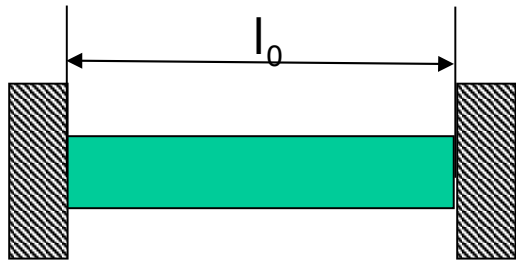
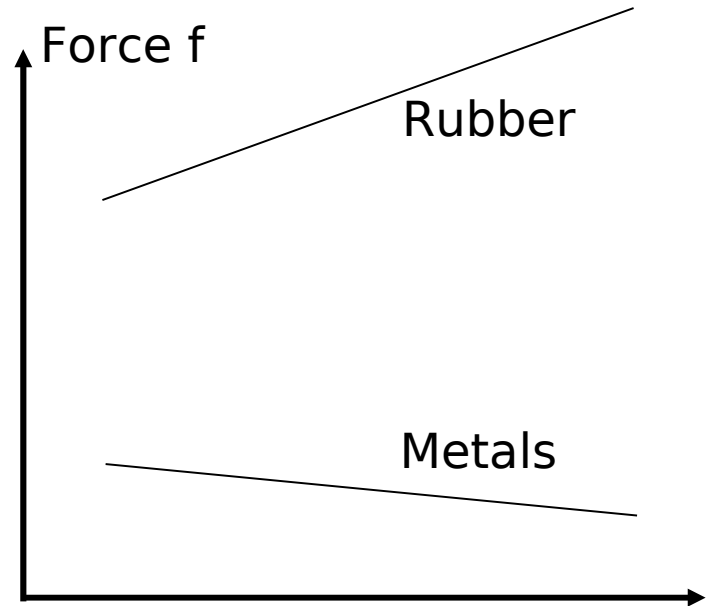
$$= \frac{1}{2\Omega_{pbc}} \sum \sum f_{ij}^1 x_{ij}^2 = \dots$$



# Deformation of long chained molecules: Lessons from rubber elasticity

$$\text{For rubber } \left(\frac{\partial f}{\partial T}\right)_l > 0$$

*Kelvin (1857)*



For a linear elastic metal

$$\epsilon = \epsilon^e + \epsilon^T$$

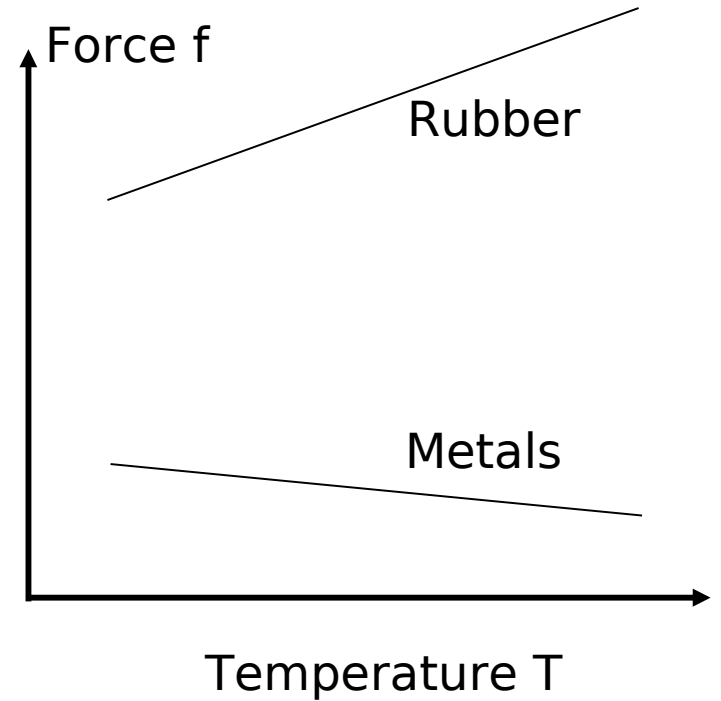
where

$$\epsilon^T = \alpha \Delta T$$

And thus,

$$\sigma = E\epsilon - \alpha E \Delta T$$

*Note:*  $\alpha > 0$



From first law of thermodynamics

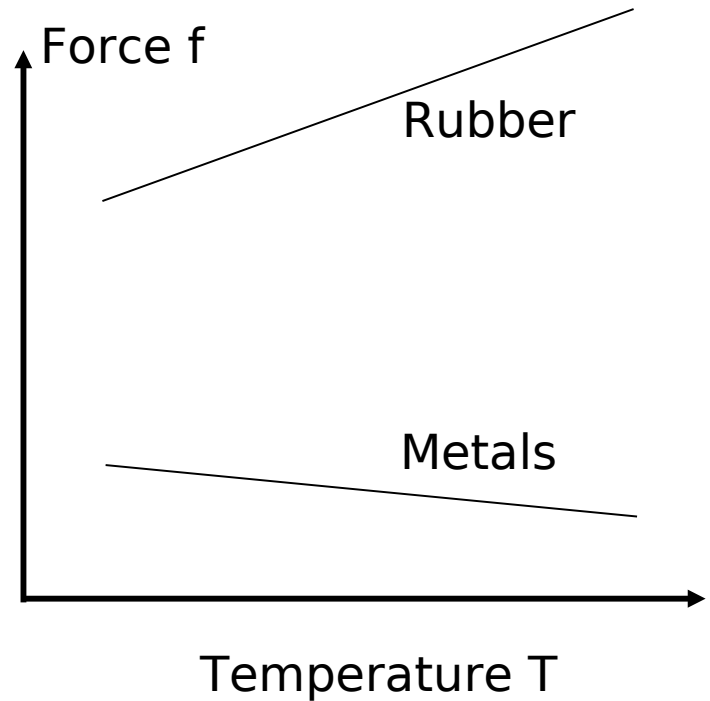
$$dQ = dU + dW$$

or for a reversible, constant volume process

$$0 = dG + SdT - fdl$$

Free energy  $G=U-TS$

Force



As all quantities are point functions

$$\left(\frac{\partial G}{\partial l}\right)_T = f$$

$$\left(\frac{\partial G}{\partial T}\right)_T = -S$$

⇒

$$\left(\frac{\partial S}{\partial l}\right)_T = -\left(\frac{\partial f}{\partial T}\right)_l$$

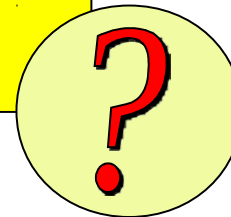
$$\left(\frac{\partial G}{\partial l}\right)_T = \left(\frac{\partial U}{\partial l}\right)_T - T \left(\frac{\partial S}{\partial l}\right)_T, \Rightarrow f = \left(\frac{\partial U}{\partial l}\right)_T + T \left(\frac{\partial f}{\partial T}\right)_l$$



$$f = \left( \frac{\partial U}{\partial l} \right)_T + T \left( \frac{\partial f}{\partial T} \right)_l$$

Energy elastic contribution to force

Entropy elastic contribution to force



$U(r)$

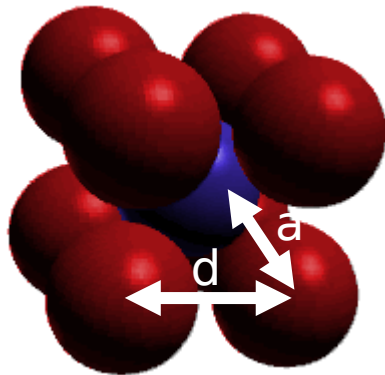
$r$

$\Delta U_d$

$\Delta U_a$

$a$

$d$



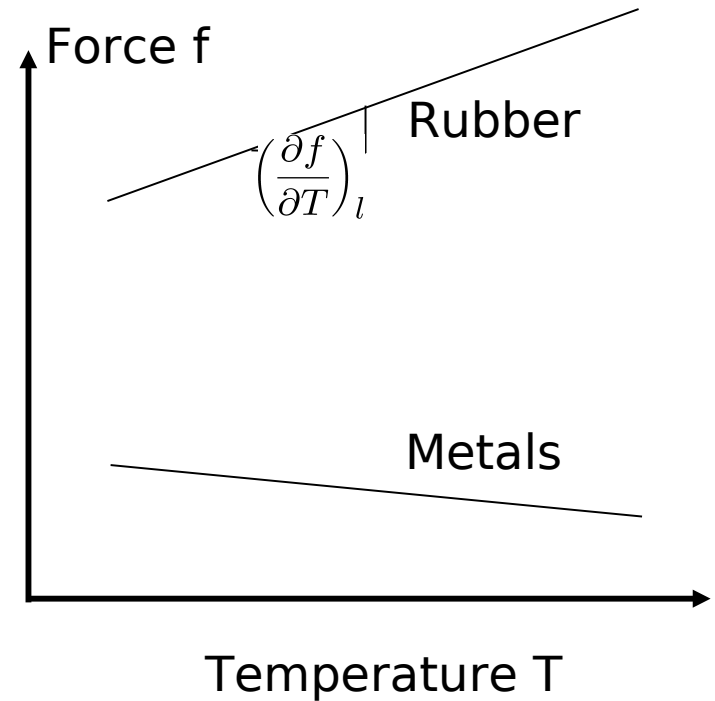


For an entropy elastic material (like rubber)

$$f \simeq -T \left( \frac{\partial S}{\partial l} \right)_T, \Rightarrow f \simeq T \left( \frac{\partial f}{\partial T} \right)_l$$

$$\left( \frac{\partial f}{\partial T} \right)_l > 0 \Rightarrow$$

entropy  $\downarrow$  with deformation at a constant temperature.

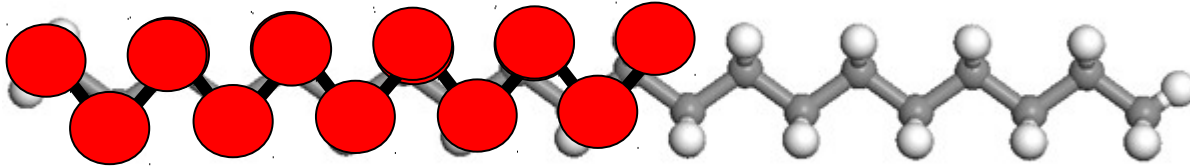


With deformation a more ordered structure emerges from a less ordered one!

Metals: energy elastic  
Rubber: entropy elastic  
Polymers: energy elastic at small strains. Behave like rubber-elasticity at large strains.



# Statistics of long chained molecules: conformations

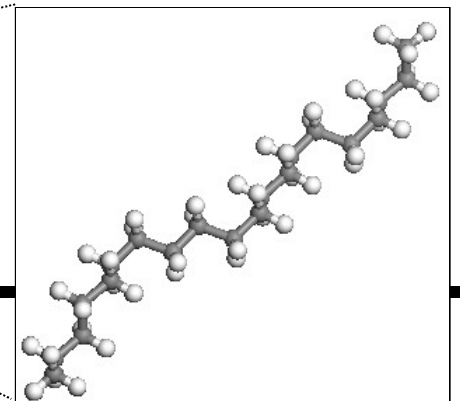
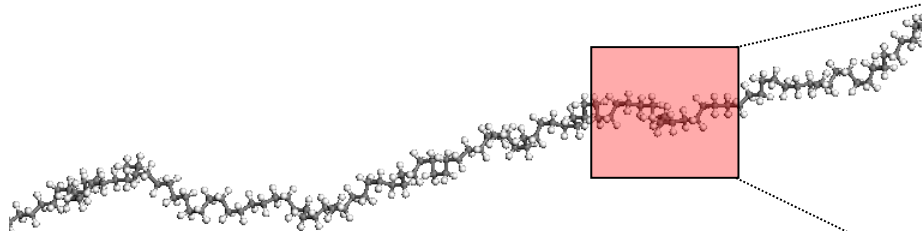


Polyethylene, the simplest of the lot.

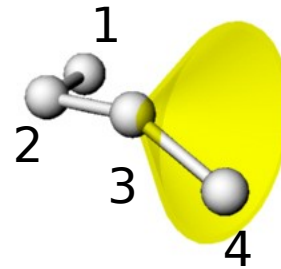
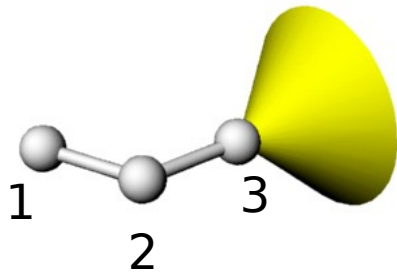
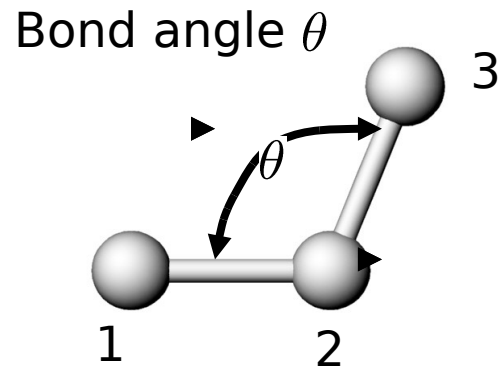
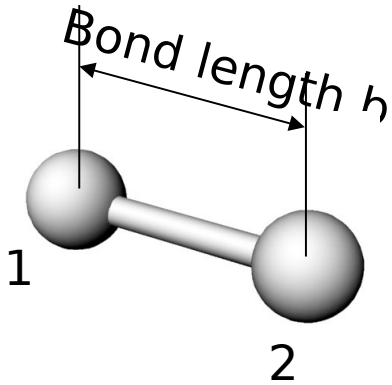
United atom model

$\text{CH}_2 \rightarrow$  one united atom.

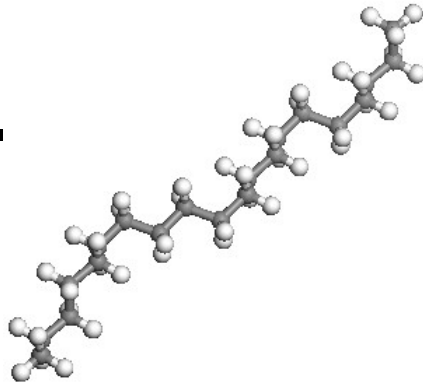
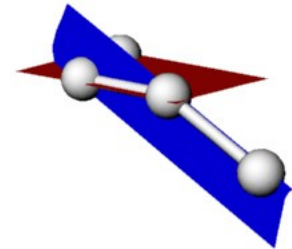
Bonds  $\rightarrow$  a nonlinear spring

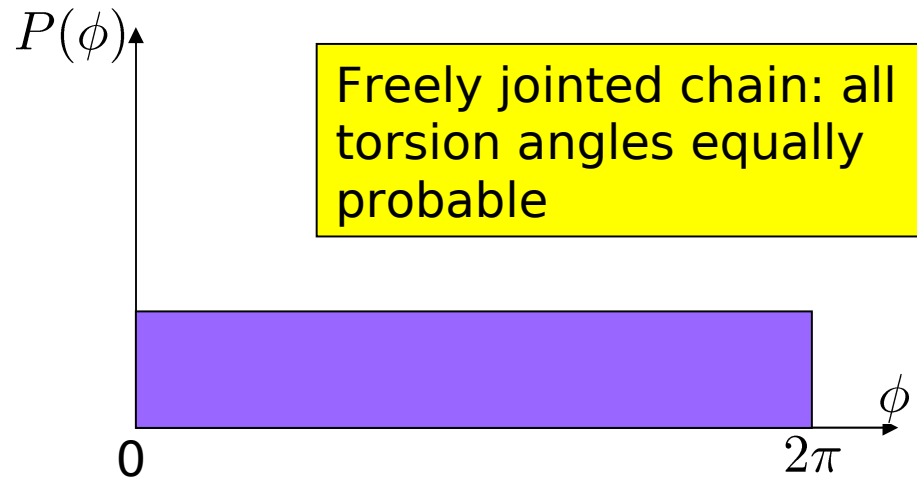
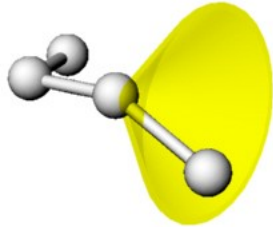


Energy minimised

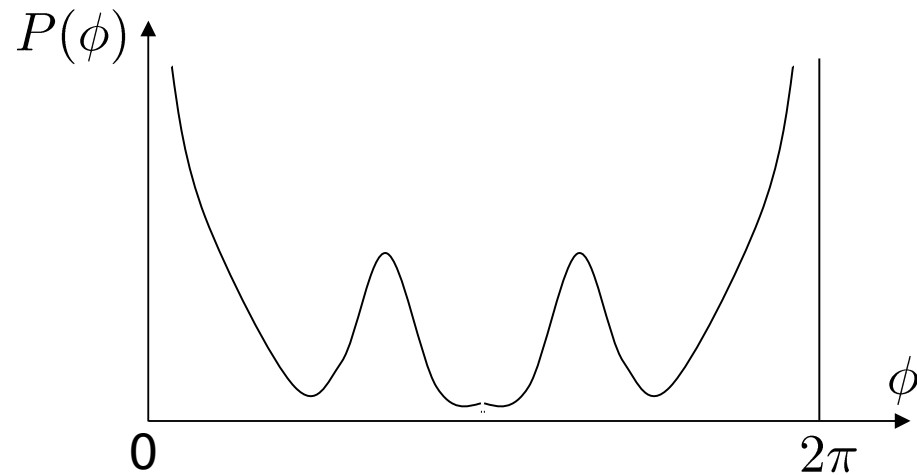


Torsion angle  $\phi$

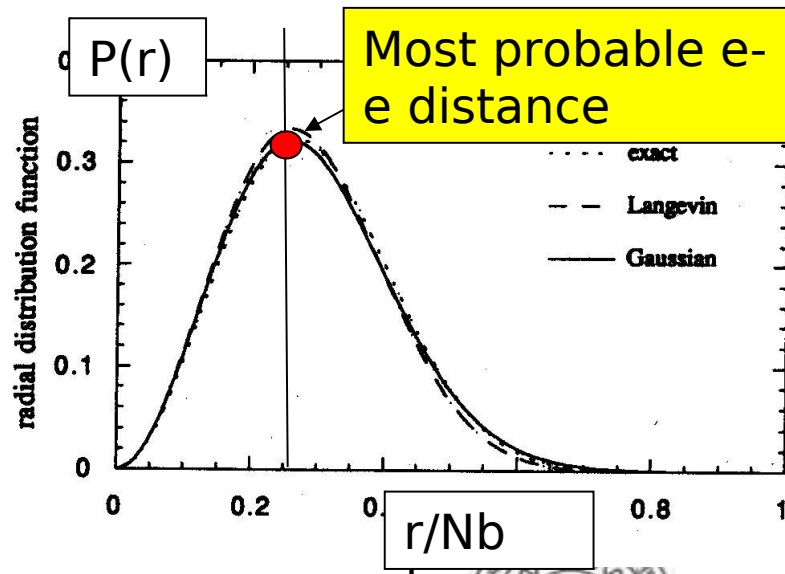
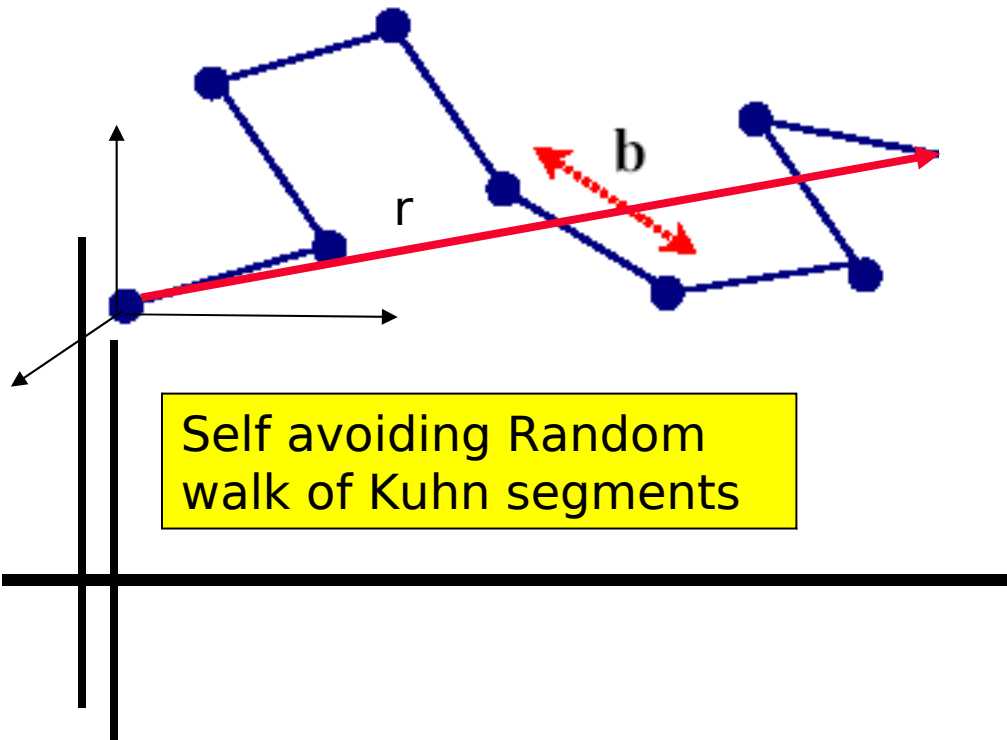
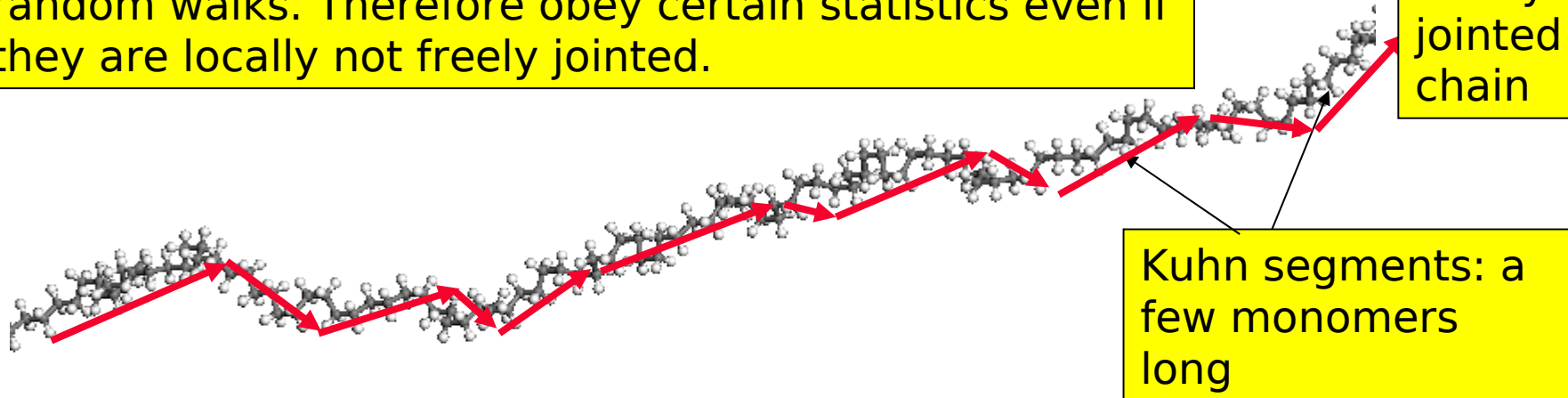




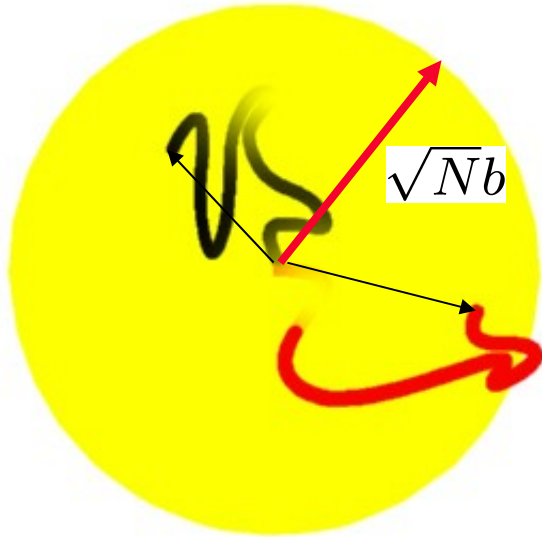
A real polymer chain has preferred torsion angles, is stiffer than a freely jointed one.



Infinitely long polymer chains qualify as self avoiding random walks. Therefore obey certain statistics even if they are locally not freely jointed.



Gaussian end to end distribution

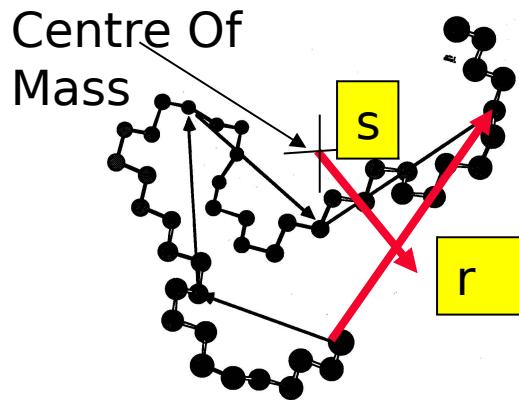


$$\langle r \rangle \propto \sqrt{Nb}$$

Radius of gyration

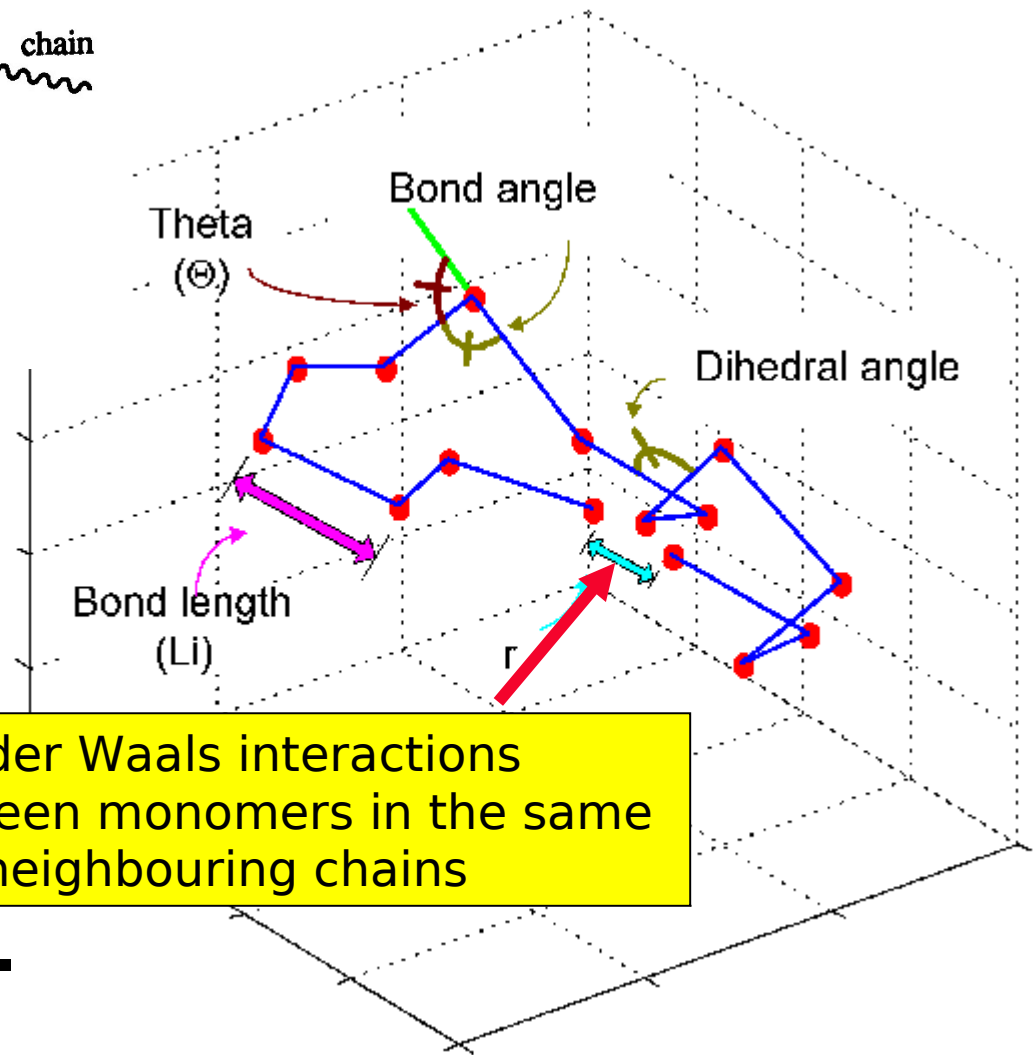
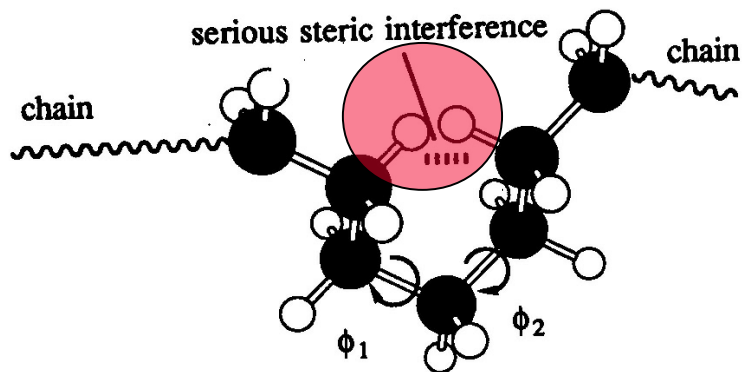
$$\frac{\langle s^2 \rangle}{\langle r^2 \rangle} = \frac{1}{6}$$

Debye(1946),  
Flory(1969)



A detailed MD ensemble of long macromolecules should obey these statistics ensuring long range order.

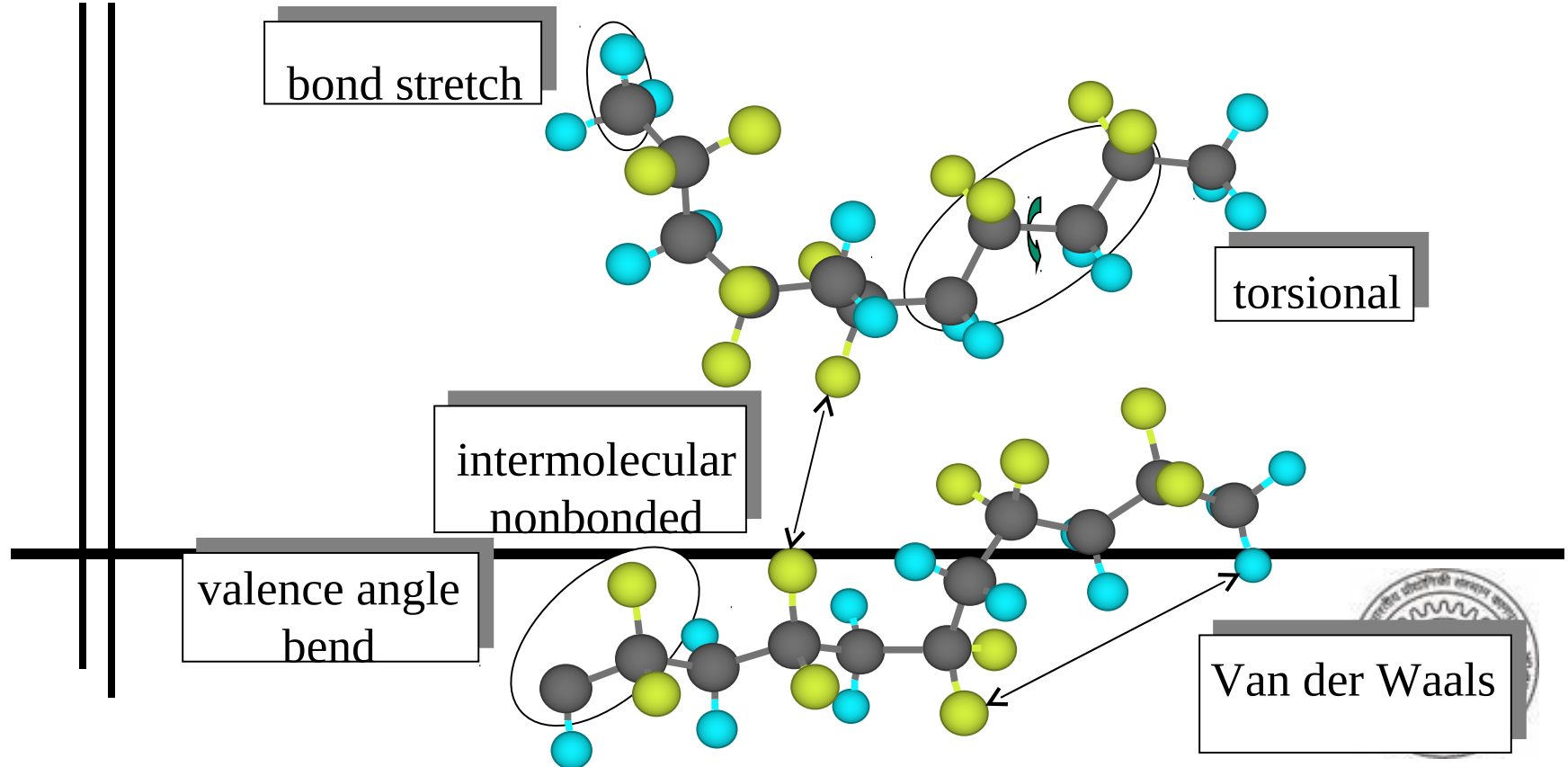
One part of a polymer chain also interacts with another part



# Essentials of a sample preparation process: ensure equilibration at short and long length scales

Total energy of an ensemble of macromolecules:

$$\mathcal{U} = \sum_{[IJ]=1}^{n_b} U_b(r_{[IJ]}) + \sum_{[IJK]=1}^{n_\theta} U_\theta(\theta_{[IJK]}) + \sum_{[IJKL]=1}^{n_\phi} U_\phi(\phi_{[IJKL]}) + \sum_{[IM]=1}^{n_{vdW}} U_{vdW}(r_{[IM]}).$$





## Typical force fields:

Bond stretching:

$$U_b(r_{[IJ]}) = \frac{1}{2}k_b (r_{[IJ]} - b)^2$$

Bond bending

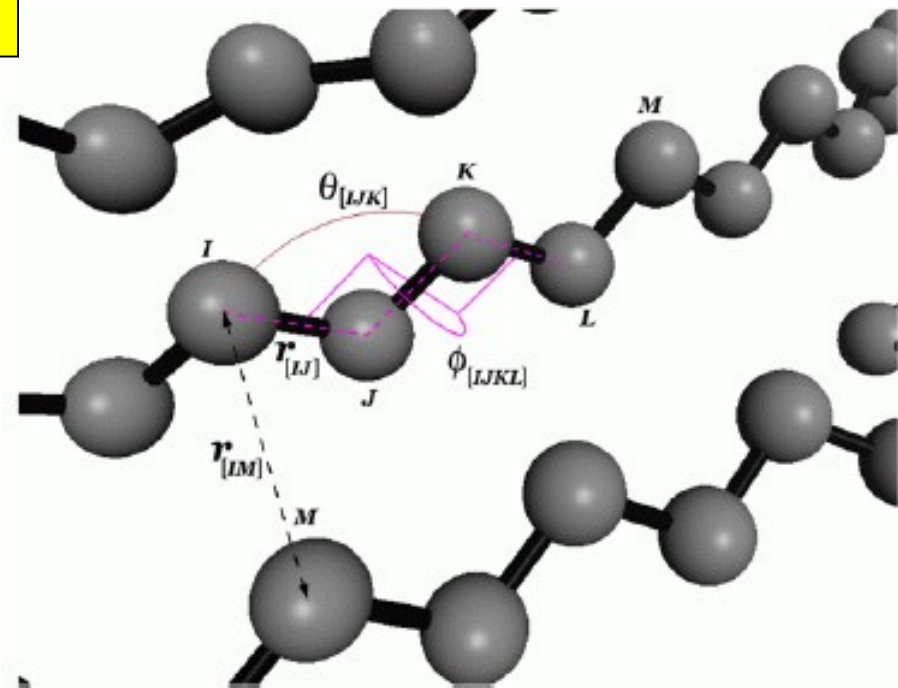
$$U_\theta(\theta_{[IJK]}) = \frac{1}{2}k_\theta (\cos(\theta_{[IJK]}) - \cos(\theta_0))$$

Dihedral:

$$U_\phi(\phi_{[IJKL]}) = \frac{1}{2}A_1(1 + \cos(\phi_{[IJKL]})) + \frac{1}{2}A_2(1 - \cos(2\phi_{[IJKL]})) \\ + \frac{1}{2}A_3(1 + \cos(3\phi_{[IJKL]}))$$

Non-bonded

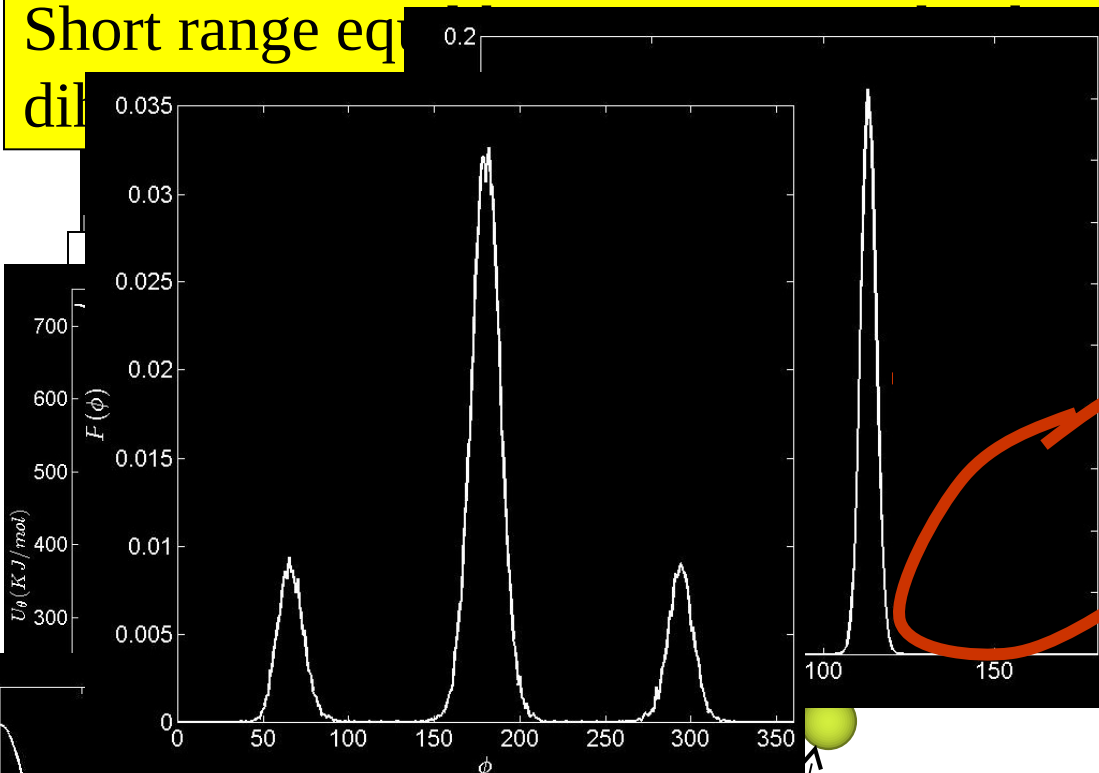
$$U_{vdW}(r_{[IM]}) = 4\epsilon \left[ \left( \frac{\sigma}{r_{[IM]}} \right)^{12} - \left( \frac{\sigma}{r_{[IM]}} \right)^6 \right].$$



Short range eq

g lengths, angles and

dil

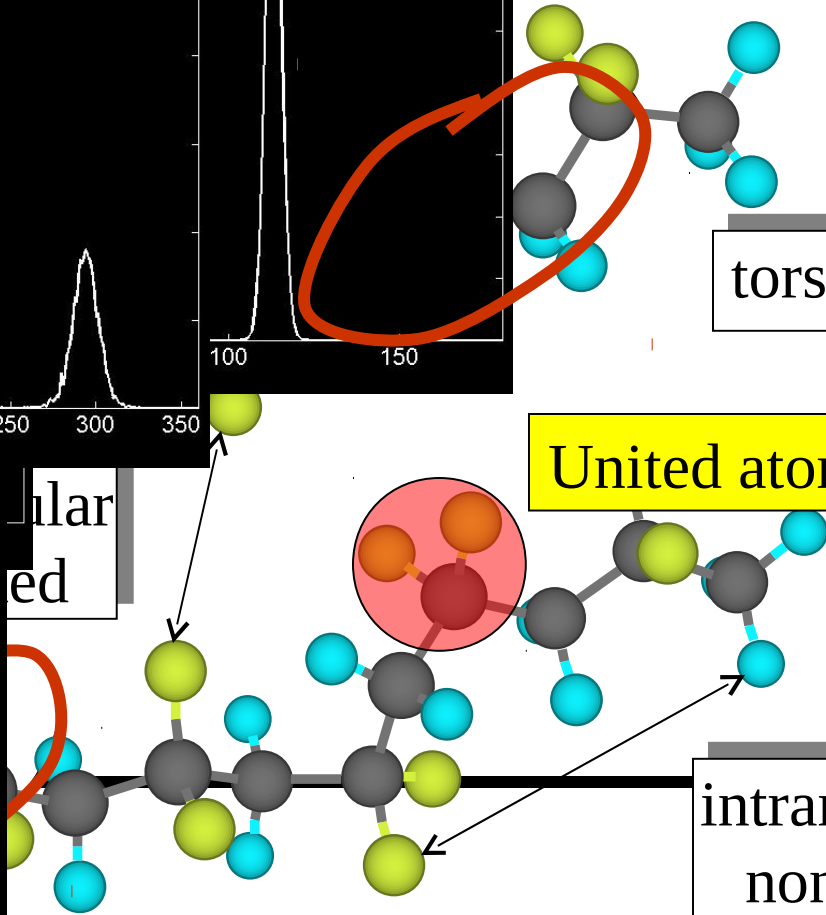


torsional

United atom

ular  
ed

intramolecular  
nonbonded



# Tests for long range equilibration are based on statistics of long chained molecules in an ensemble

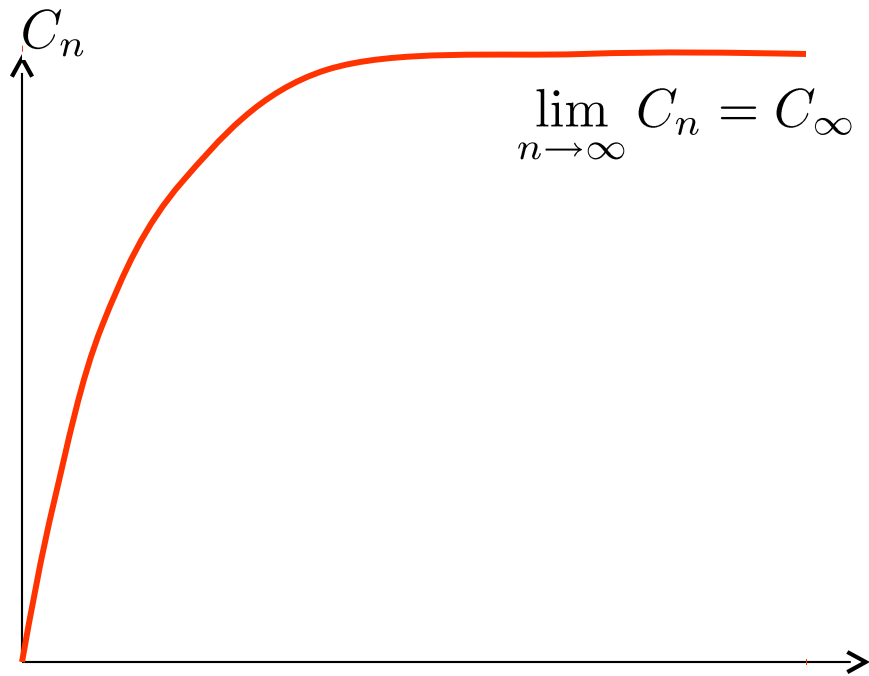
For a freely jointed chain, the squared end-to-end distance of a chain is:

$$\langle r^2 \rangle_{FJ} = Nb^2$$

For a very long real chain, characteristic ratio

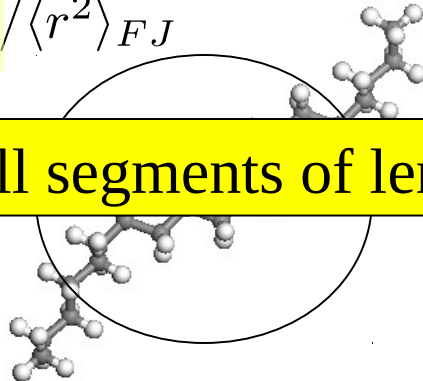
$$C_\infty = \frac{\langle r^2 \rangle}{\langle r^2 \rangle_{FJ}}$$

$$C_n = \langle r_n^2 \rangle / \langle r^2 \rangle_{FJ}$$



Chain length  $n$

Average over all segments of length  $n$  in the ensemble

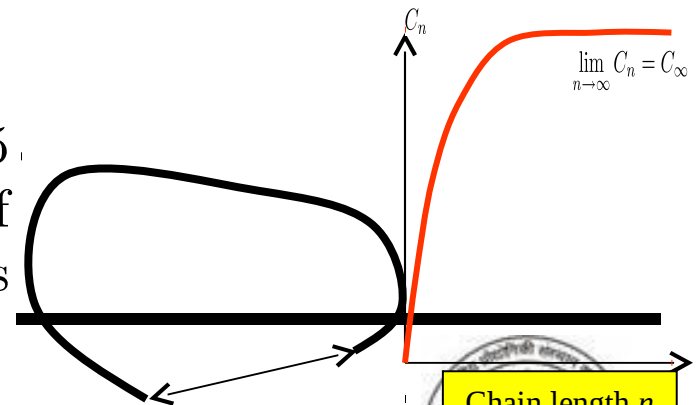
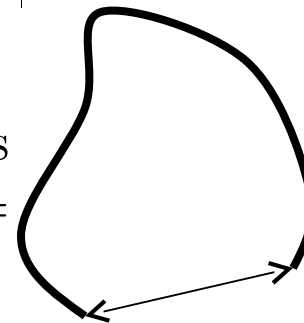
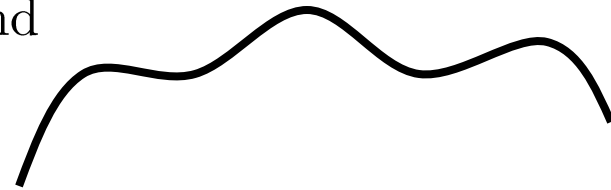


## Steps involved in equilibration $T > T_g$

Build a single chain with the equilibrium bond length, angle and dihedral distributions.

Conjugate gradient based energy minimisation is performed with end to end distance held at  $\langle r^2 \rangle = C_\infty nb^2$ .

The chain is further equilibrated using only 1 – 5 non bonded interactions so that a large number of chain conformations can be sampled. A chain is chosen that is closest to the target structure.

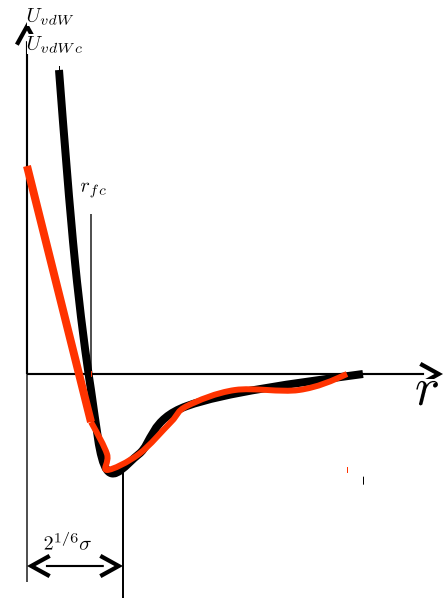
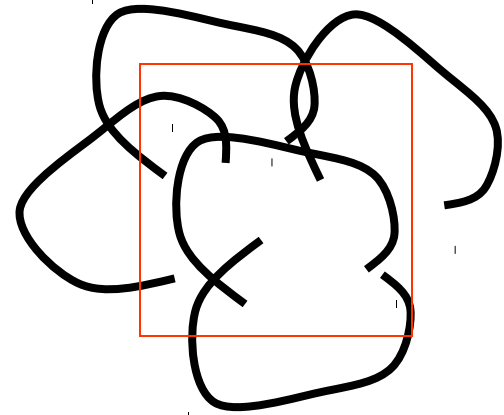


Requisite number of replicas of the selected chain are packed into a box with the box size corresponding to an overall specified density. The chains are then subjected to a zero temperature Monte Carlo optimization whereby they are translated, rotated and reflected with a view to reduce local density fluctuations

A ‘slow push off’ is performed on the ensemble using a force capped LJ potential  $U_{vdWc}$  of the form

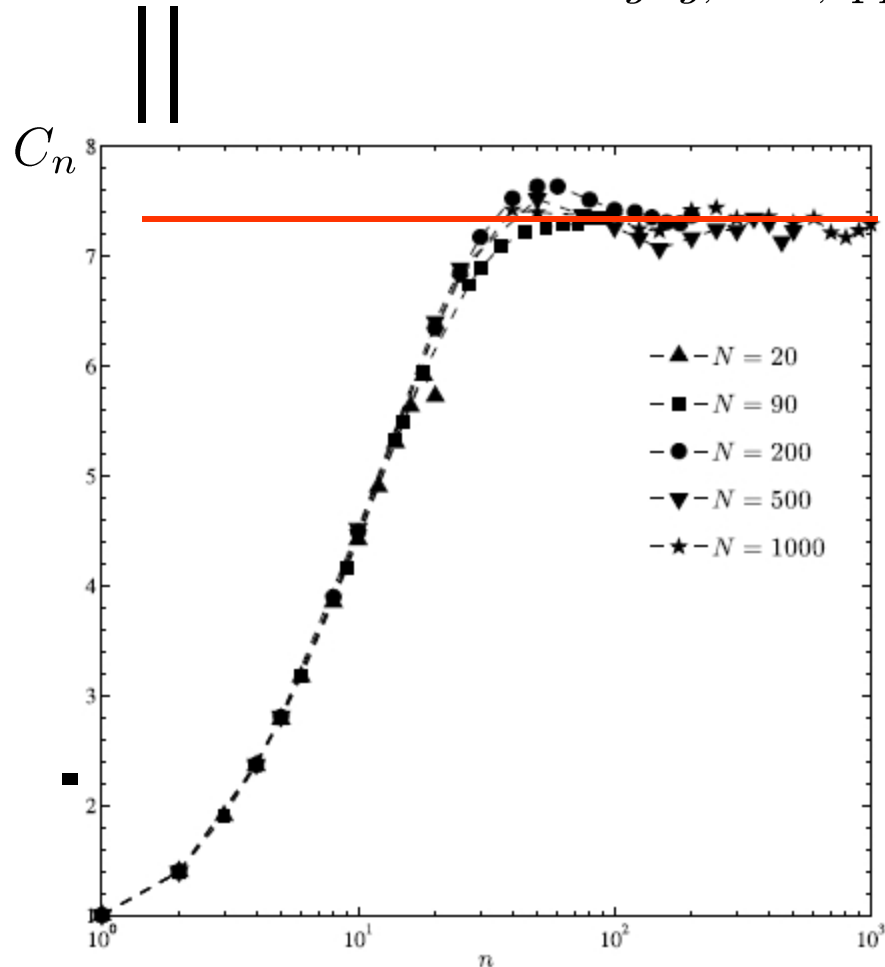
$$U_{vdWc} = \begin{cases} (r - r_{fc})U'_{vdW}(r_{fc}) + U_{vdW}(r_{fc}) & r < r_{fc} \\ U_{vdW}(r) & r \geq r_{fc} \end{cases}$$

typically, we gradually reduce  $r_{fc}$  from  $2^{1/6}\sigma$  to  $0.8\sigma$  in 10 stages. Again, only the 1–5 non-bonded interaction is active.



Finally, slow push off is followed by full MD equilibration for a long time with the full LJ potential switched on.

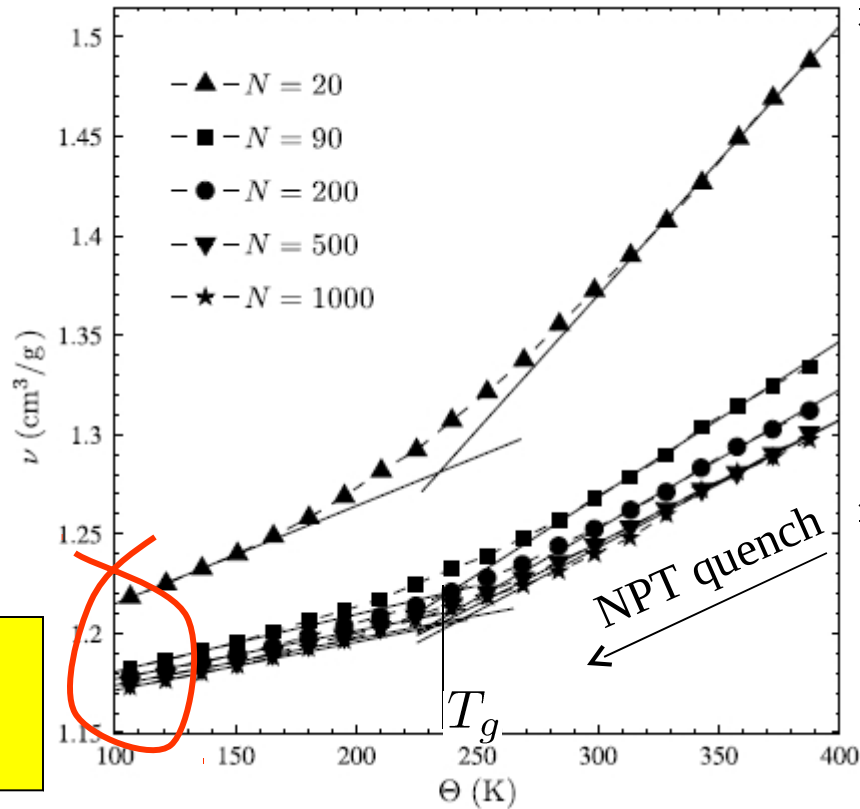
*Auhl et al., 2003, J. Chem. Phys., v119, pp12718; Mahajan and Basu, 2010, Model. Simul Mater Sc Engng, v18, pp025001*



$C_\infty \simeq 7$   
Experimental:  $C_\infty = 6.8$  for PE  
under theta conditions



Quench!



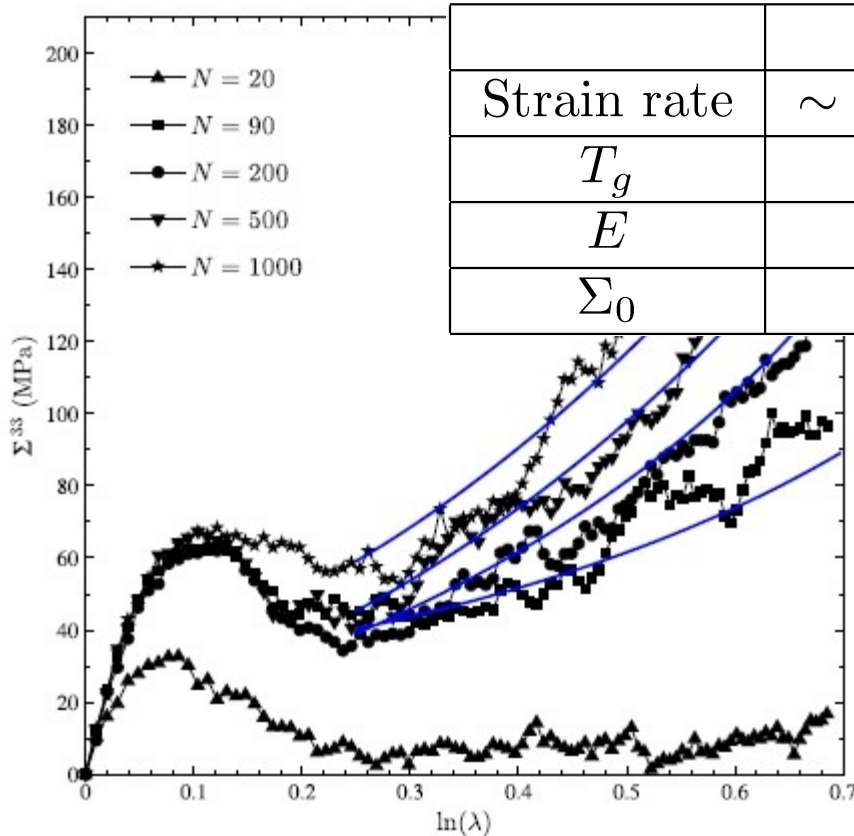
Glassy samples

Equilibrated samples

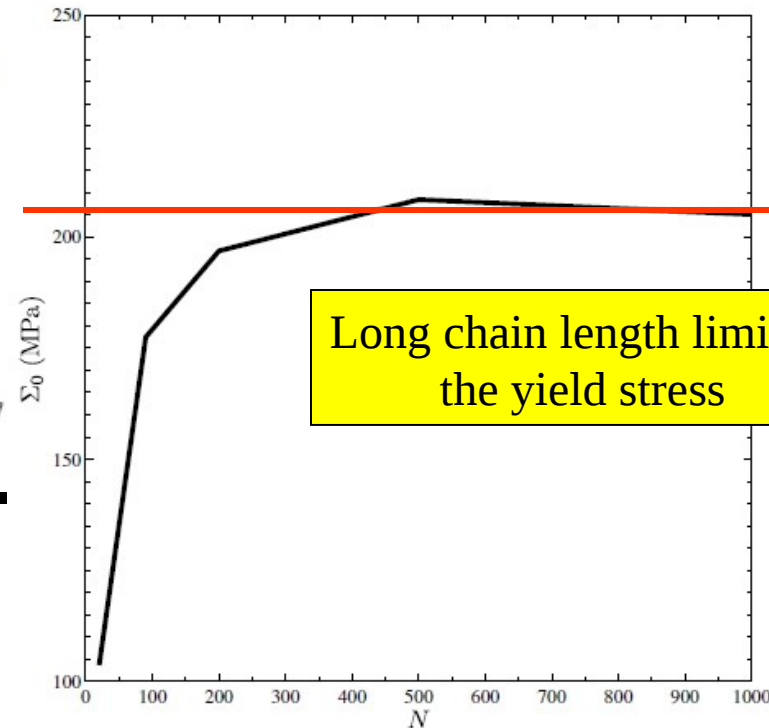
PE is semi-crystalline in reality but can be quenched to an amorphous glass at the high quenching rates used in MD. The equilibrated structure at  $T > T_g$  is preserved in the glassy sample.

# Pull under $N\Sigma^{11}\Sigma^{22}T$

\*Gaur and Wunderlich, 1980, *Macromolecules*, v13, pp445

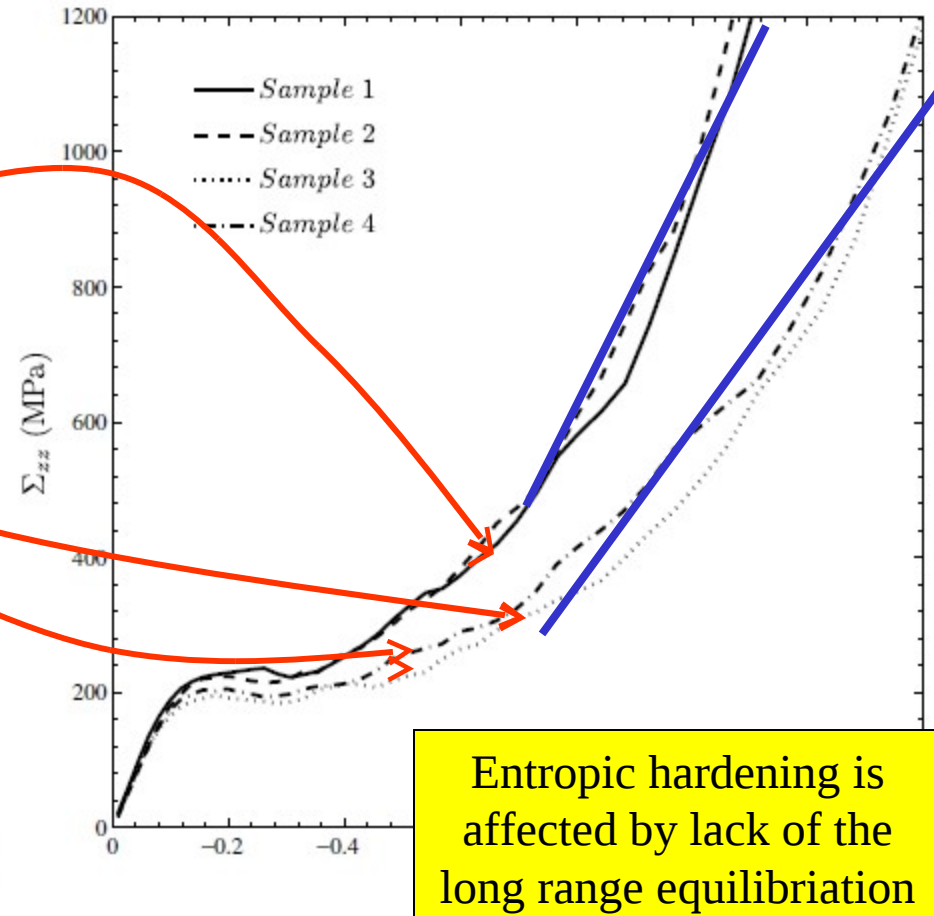
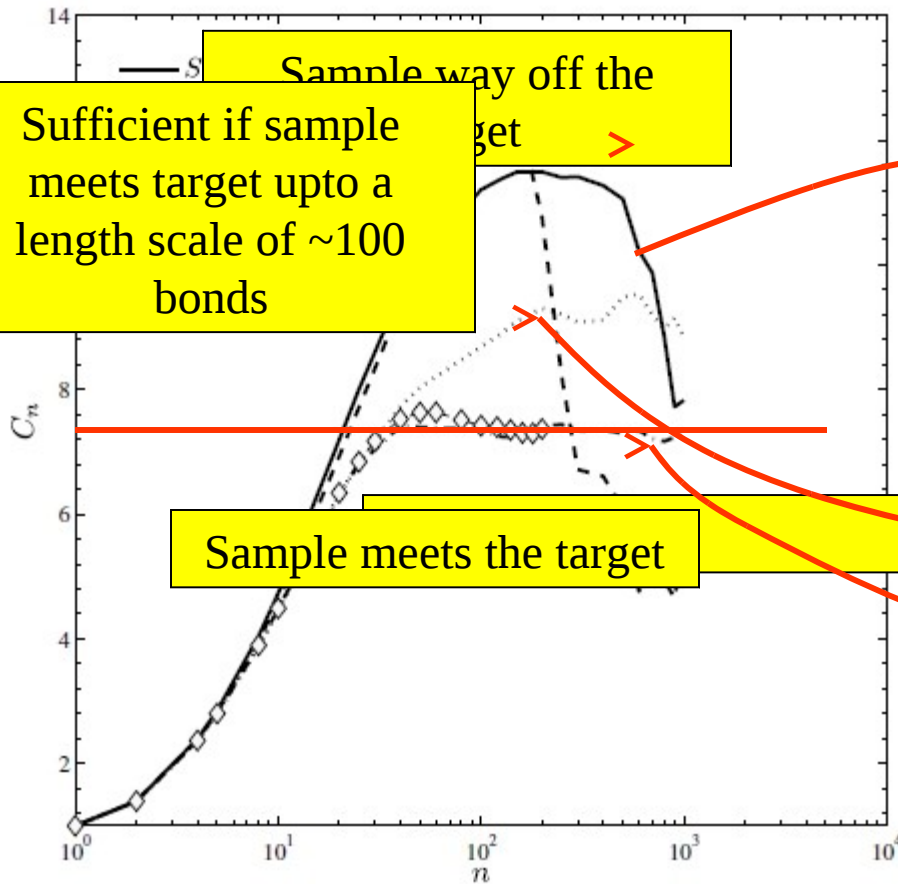


|             | MD                                      | Experiments                  |
|-------------|---|------------------------------|
| Strain rate | $\sim 2 \times 10^{-4} \text{ ps}^{-1}$ | $1 - 10^{-4} \text{ s}^{-1}$ |
| $T_g$       | 240 K                                   | $\sim 245 \text{ K}^*$       |
| $E$         | 1.8 GPa                                 | 1.5 GPa                      |
| $\Sigma_0$  | 200 MPa                                 | 120 MPa                      |





# The price of disobeying!



## Does the MD ensemble behave like a chunk of continuum?

Recall that the underlying continuum deformation is *homogeneous* and is given by

$$x_1 = \lambda_1 X_1$$

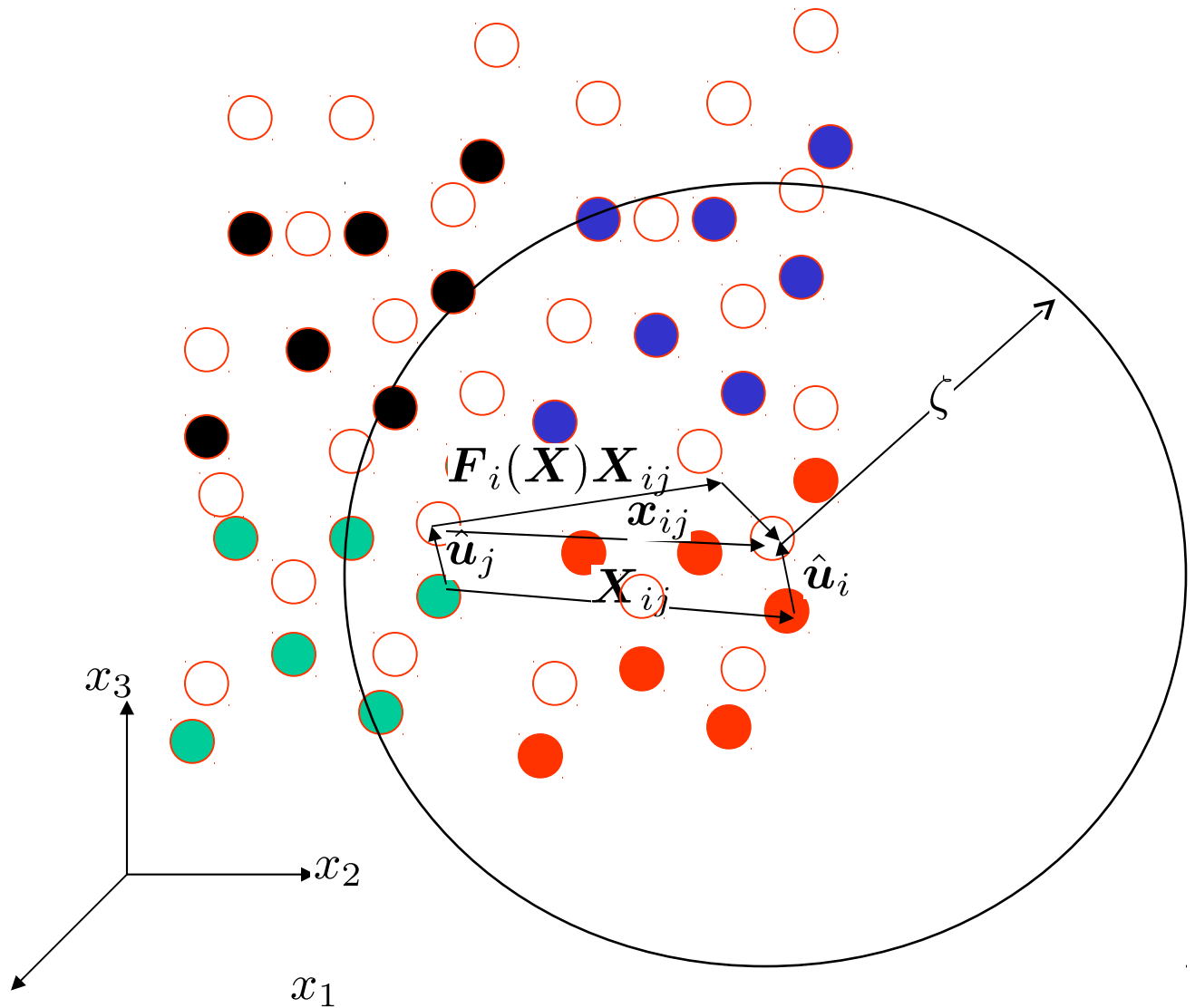
$$x_2 = \lambda_2 X_2$$

$$x_3 = \lambda X_3$$

such that

$$E^{33} = \lambda^2 - 1.$$



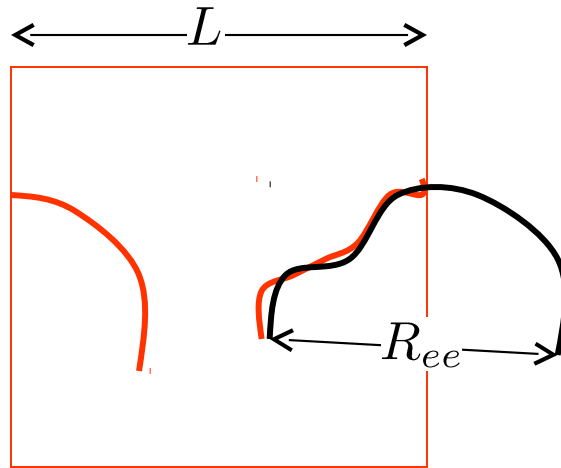


The local deformation gradient  $\mathbf{F}_i$  is determined by minimising

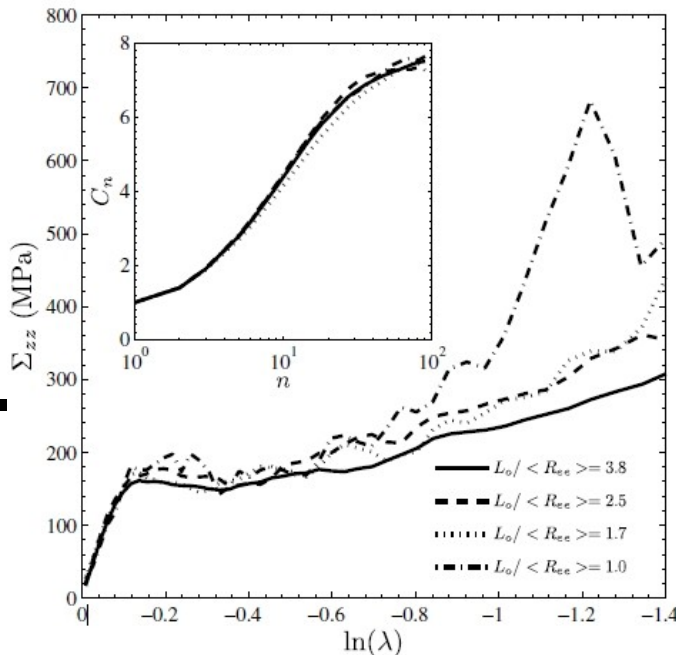
$$\Pi = \sum_{j \in \Omega(\zeta)} |\mathbf{F}_i \mathbf{X}_{ij} - \mathbf{x}_{ij}|.$$



# How big a sample to take ?



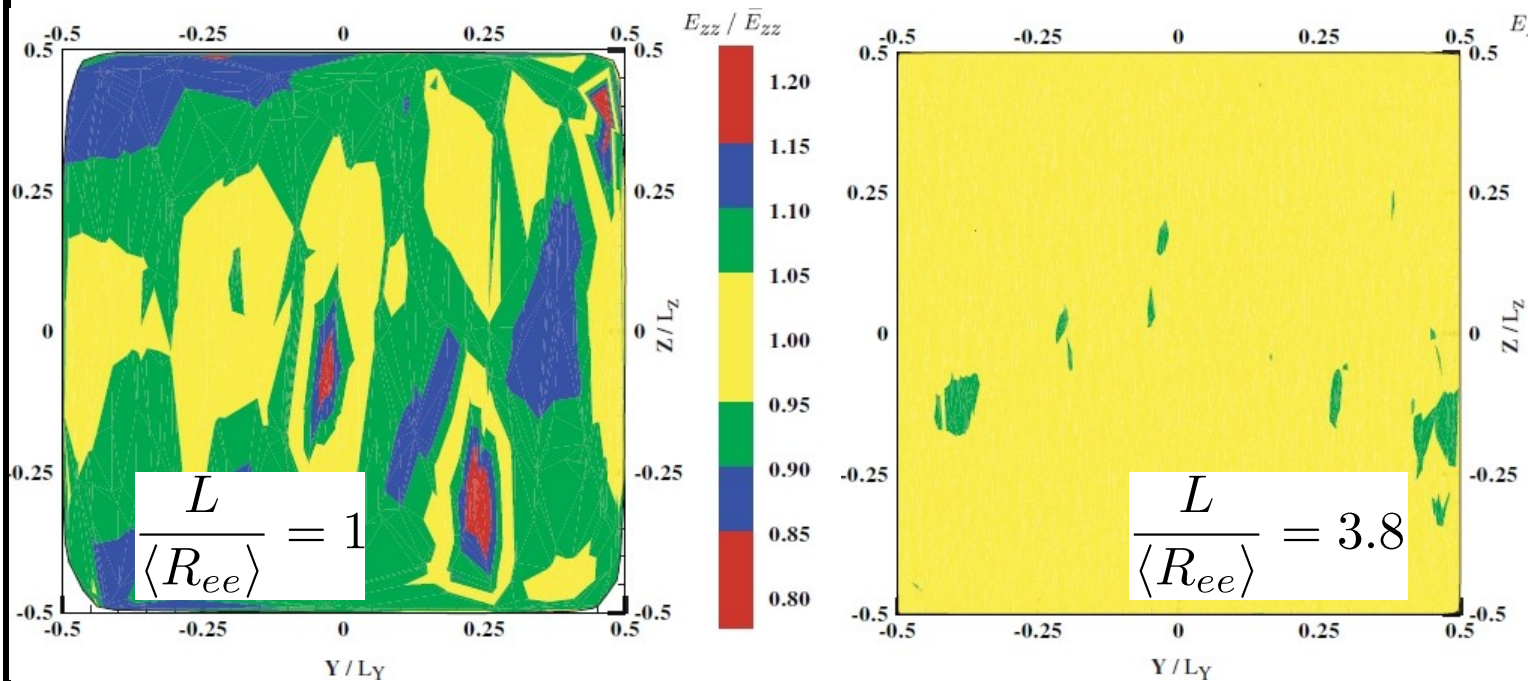
We check if, all things remaining equal, the mechanical response depends on  $L/\langle R_{ee} \rangle$ .



$L/\langle R_{ee} \rangle \sim 3$  is needed for a smooth stress strain response  $\Rightarrow$  ensembles with longer chains need bigger boxes, more monomers and hence more expensive simulations.



Sample sizes  $> 3$  times the average end to end distance attains an almost homogeneous strain distribution

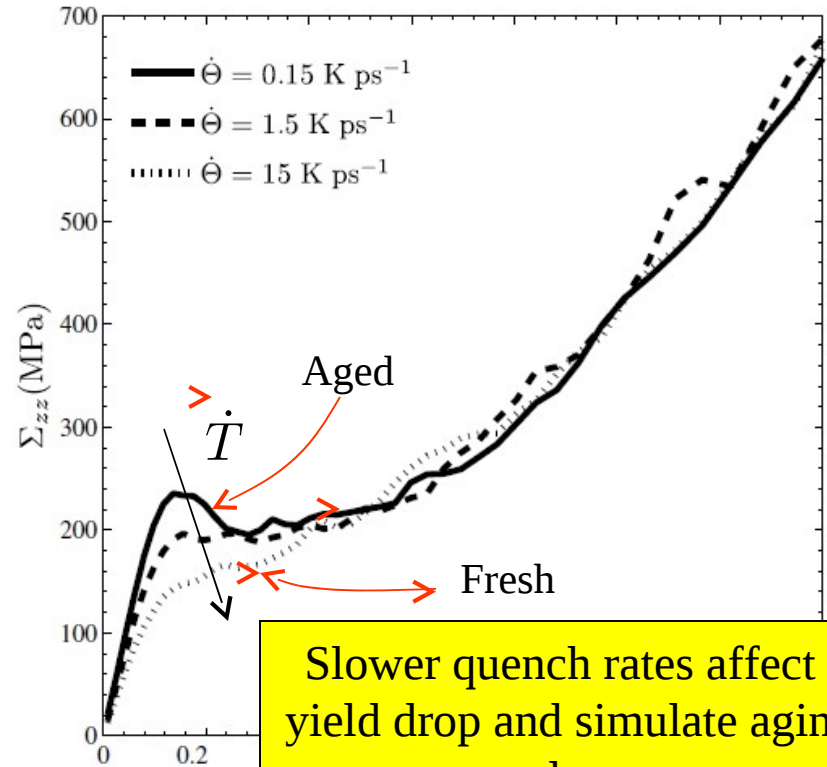
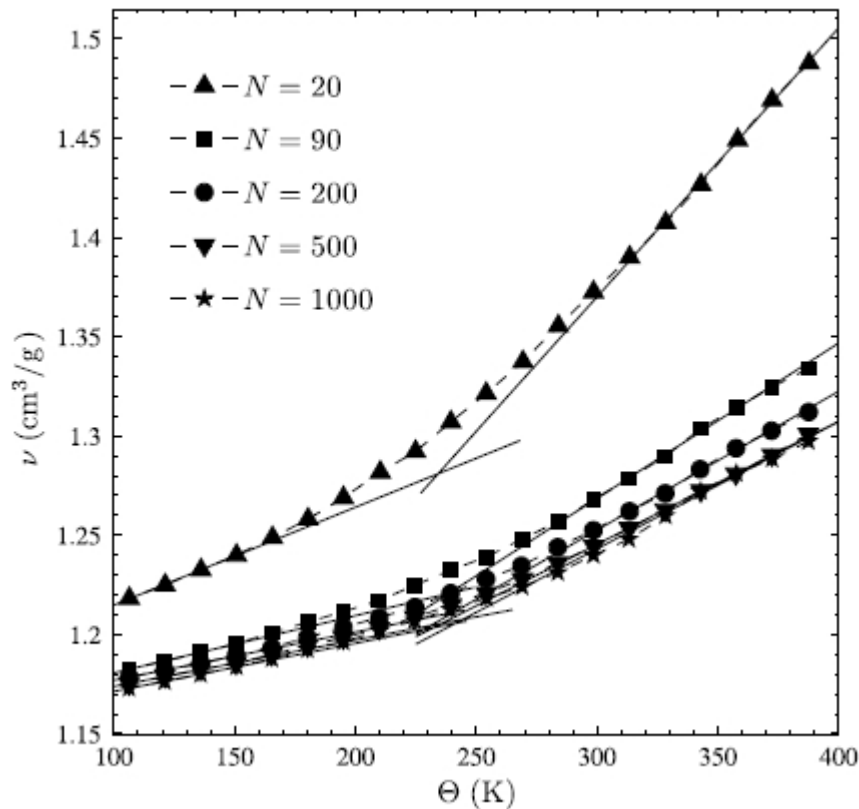


A larger sample is more continuum-like.



# How fast should we quench and pull?

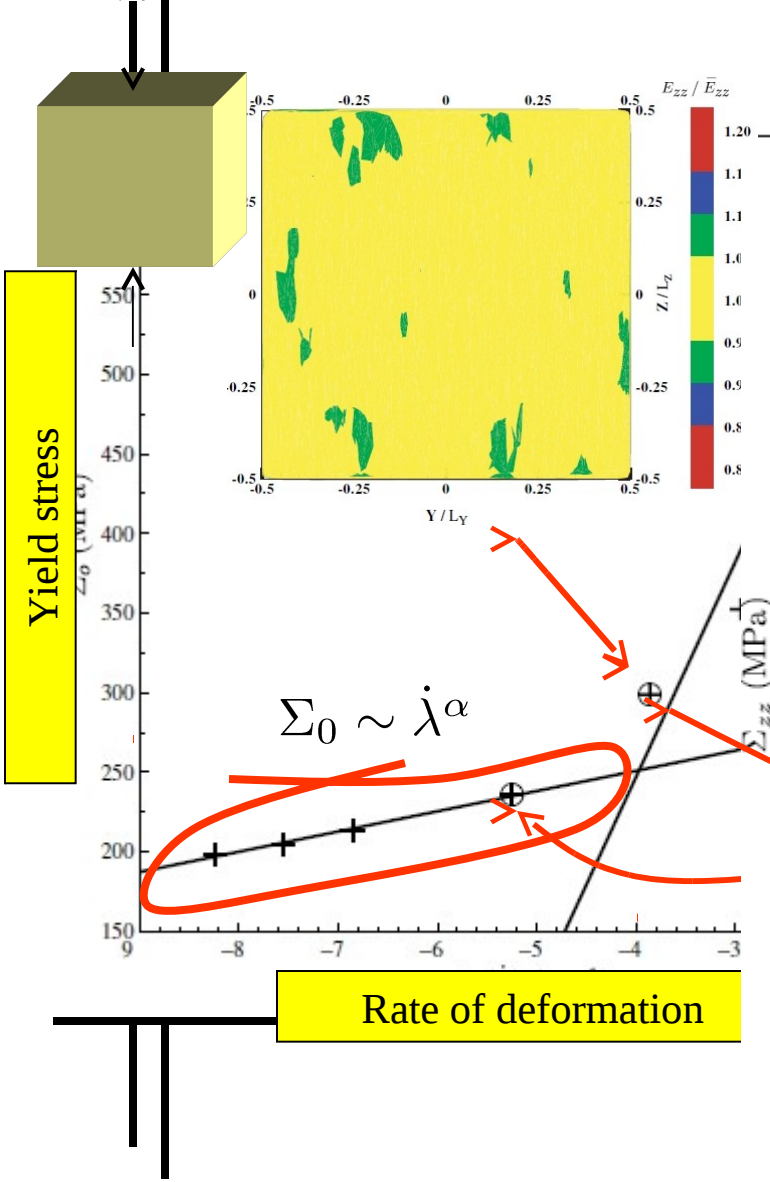
Real life quench rates are about  $0.3 \text{ K/s} = 0.3 \times 10^{-12} \text{ K/ps}$



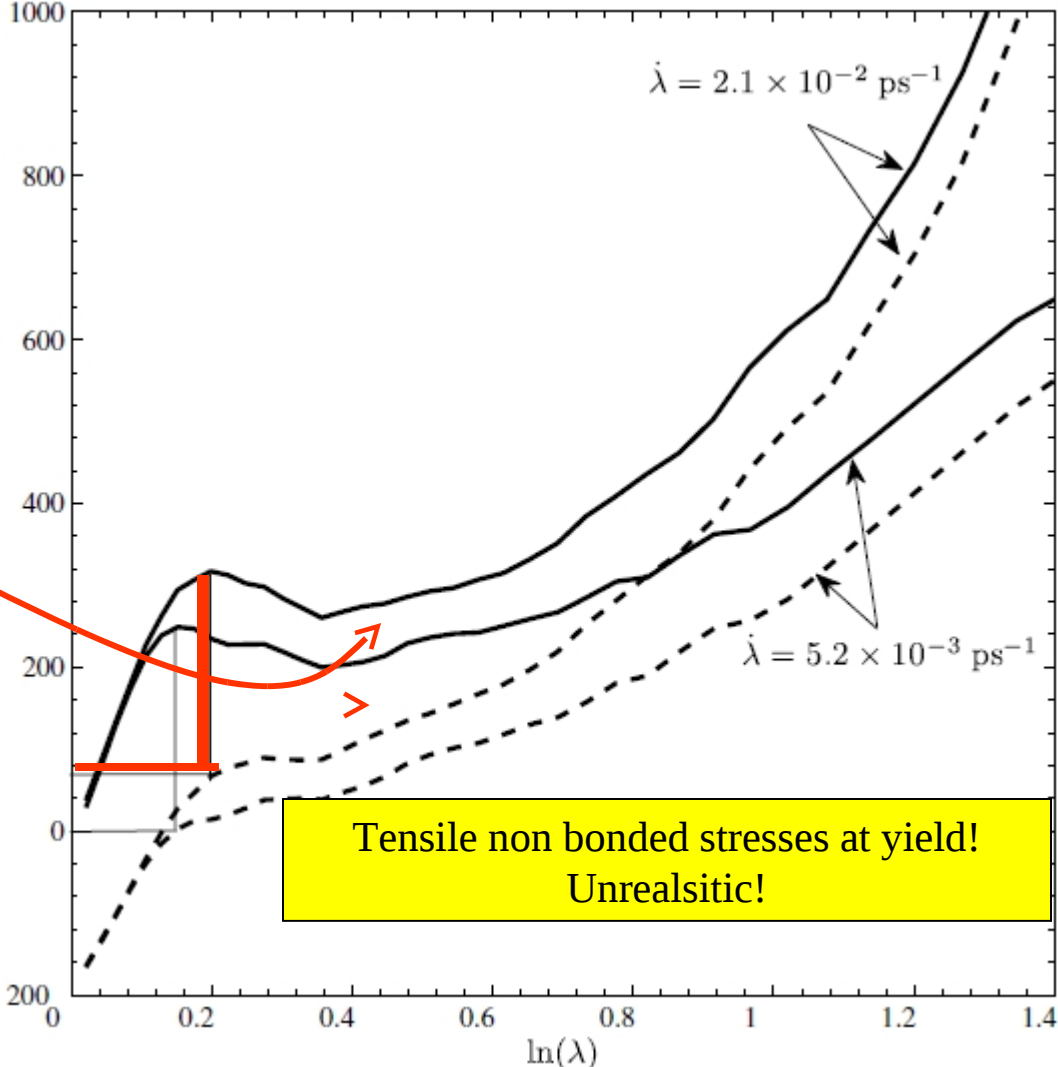
Slower quench rates affect the yield drop and simulate aging in polymers.



Rate of pulling has a significant effect on the yield stress.



Polymers are rate sensitive in re-



## Conclusions: Now we can pull out numbers!

Suppose you wish to simulate a linear polymer of density  $1000 \text{ kg/m}^3$ . Chain length 1000 monomers, weight of each united atom  $14 \text{ g/mol} = 2.3 \times 10^{-26} \text{ kg}$ . Main chain bond length  $b = 1.53 \text{ angstrom}$

Expected end to end distance is  $\langle R_{ee} \rangle = \sqrt{Nb^2}$  or  $48.4 \text{ angstrom}$

Size of periodic box required  $3 \times \langle R_{ee} \rangle \simeq 144 \text{ angstrom}$

Number of chains of 1000 united atoms/chain required is about 129, i.e an ensemble with 129000 united atoms.

Safe strain rates  $\dot{\lambda} \sim e^{-7} \text{ ps}^{-1}$ .

Time required to impart a stretch of 2, i.e doubling of the box size, 2200 ps.





## What we did not talk about ...

Coarse graining: the art and science of reducing complicated linear architectures (PS, PC, PVC etc) to polyethylene-like chains.

Primitive path analysis: Characterisation of the entanglement network

Constitutive modelling: Extracting parameters of continuum constitutive models from MD simulations

