

Hierarchical Modeling of Polymer Nanocomposites: From Ab-initio, to Atomistic up to Coarse-grained Simulations

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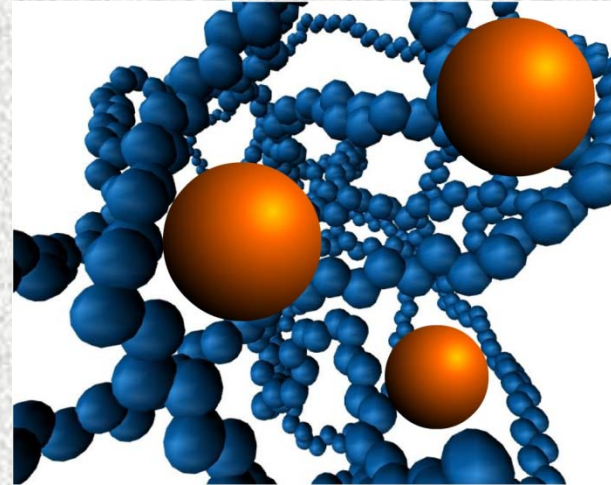
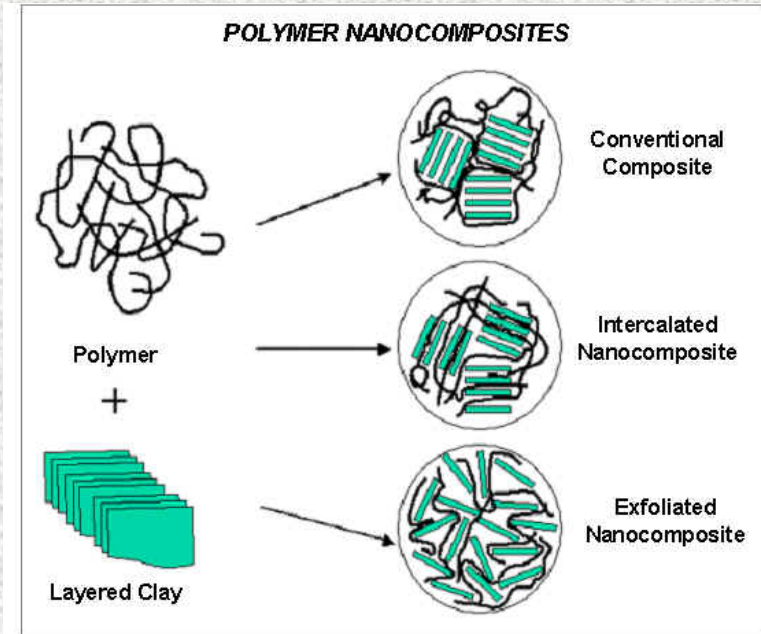


KITP, Santa Barbara, 18/06/12

Outline

- **Introduction:** General Overview of Polymer Surfaces/Interfaces. Confined systems. Characteristic Length-Time Scales.
- **Multi-scale Particle Approaches:** Ab-initio (DFT), Microscopic (atomistic) and Mesoscopic (coarse-grained) simulations.
- ☐ **Applications:**
 - ✓ Polymer/Metal hybrid systems.
 - ✓ Polymer/Graphene interfaces.
- **Conclusions – Open Questions.**

INTRODUCTION - MOTIVATION



- ❑ **Hybrid **Polymer/solid nanocomposites:**** particles are used to enhance/modify the properties of the entire system:
 - **Thermodynamics**
 - **Mechanical properties**
 - **Dynamical/rheological behavior**
 - **... etc.**

INTRODUCTION

THEORIES & COMPUTER SIMULATIONS:

- **probe microscopic structural features**
- **organization of the adsorbed groups**
- **dynamics at the interface**
- **study in the molecular level**

□ Obtain information about the **spatial dependence** of:

- the **short-time (local) dynamics**
- the **long-time** self diffusion coefficient

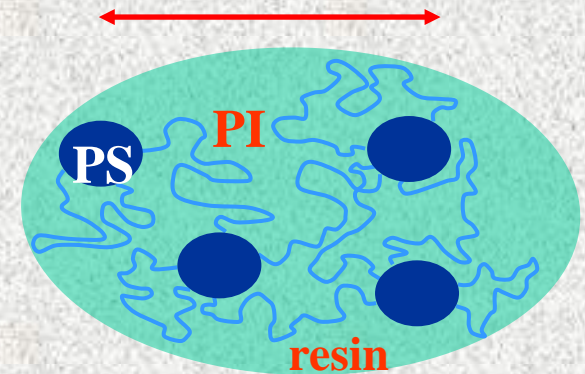
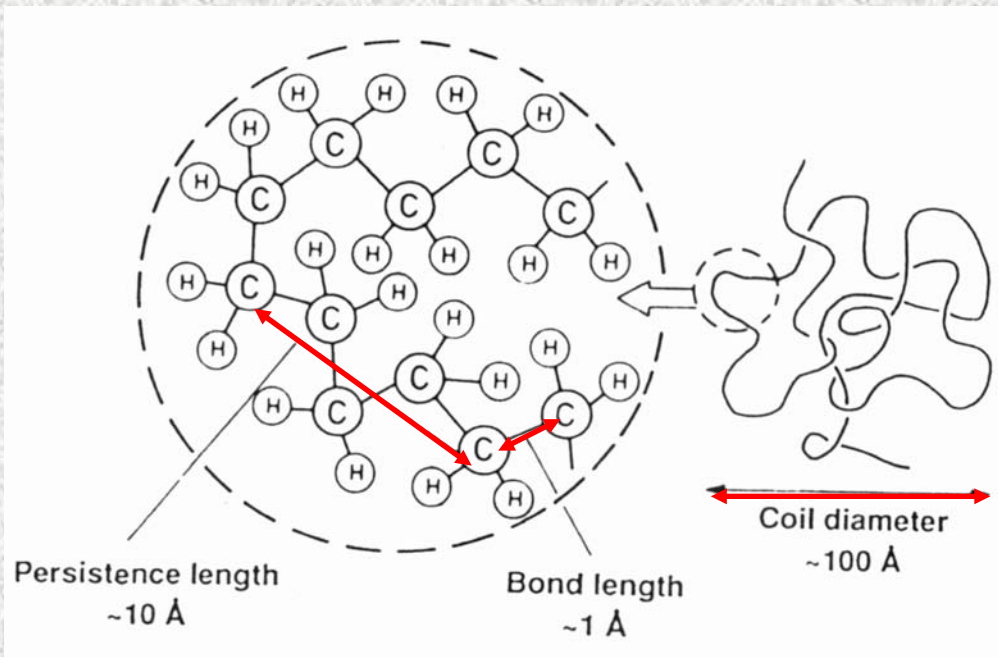
□ **Structure – Properties** relations

□ Example - Open question: **what is the extend of the surface effect on the lateral motion (diffusion) of the polymer chains?**

-- **Experimentally: from 3-4 R_G [Lin et al. 1997] to 25 R_G [Frank et al. 1996]**

Time – Length Scales Involved in Polymer Composite Systems

- **Bond length** $\sim 1 \text{ \AA}$ (10^{-10} m)
- **Kuhn length or persistence length** $\sim 10 \text{ \AA}$
- **Radius of gyration** $\sim 100 \text{ \AA}$
- **Phase separated polymers** $\sim 1 \text{ \mu m}$ (10^{-6} m)



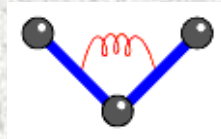
- **Polymer/solid interface** length scales $\sim ?$

Time – Length Scales Involved in Polymer Composite Systems

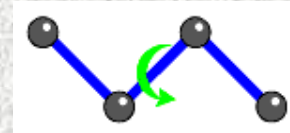
❑ **Bond vibrations:** $\sim 10^{-15}$ sec



❑ **Angle rotations:** $\sim 10^{-13}$ sec

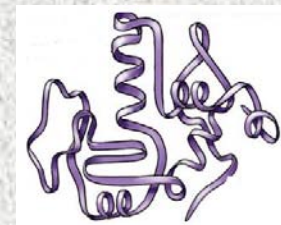


❑ **Dihedral rotations:** $\sim 10^{-11}$ sec



❑ **Segmental relaxation:** 10^{-9} - 10^{-12} sec

❑ **Maximum** relaxation time of a chain, τ_1 : ~ 1 sec (in $T < T_m$)



❑ **Polymer/solid interface** characteristic relaxation times: ?

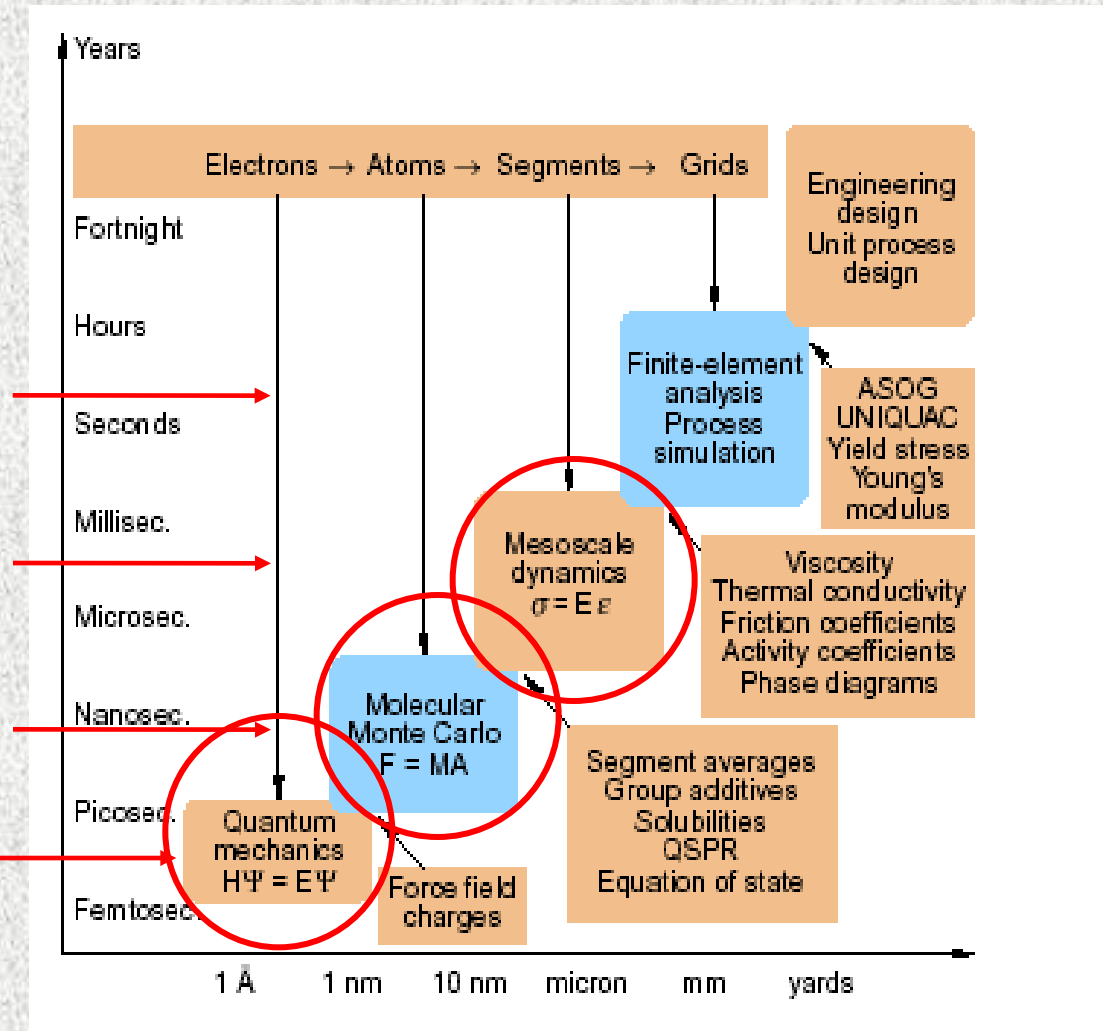
Hierarchical Modeling of Molecular Materials

D) description in macroscopic -
continuum level

C) description in mesoscopic
(coarse-grained) level

B) description in microscopic
(atomistic) level

A) description in quantum
level

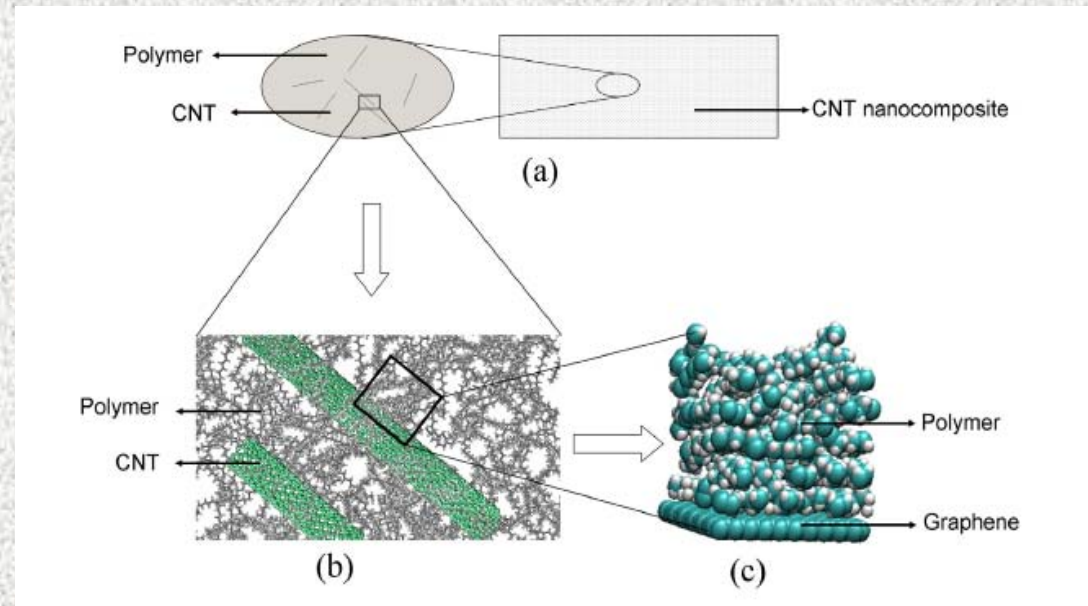


- Main goal: Built rigorous “bridges” between different simulation levels. Quantitative prediction of properties of hybrid complex systems.

INTRODUCTION

➤ **Physics-based Multi-scale modeling:** key factor for the **design** and the **optimization** of composite materials.

❑ **Model System: Polymer/solid interfaces.**



☞ **Interface:** junction between two homogeneous bulk phases

☞ **A region of finite thickness** due to finite range of intermolecular forces (interface - interphase)

phase α

interphase S

phase β

Application - Modeling of Polymer Interfacial Systems: Polymer/Metal Interfaces

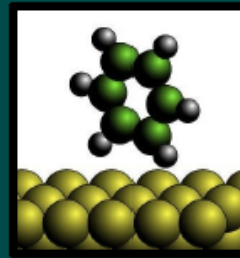
How does a surface affect:

- structure
- interphase width
- dynamics
- glass transition temperature

of a polymer?

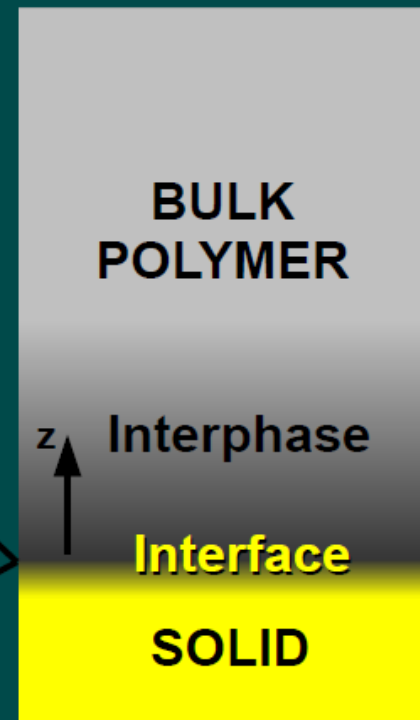
Multiscale modelling

Gold used in (resonance enhanced) dynamic light scattering experiments



Chemistry important
quantum

Structure, dynamics
classical



➤ **Questions:** (1) Can we calculate analytically metal / molecule (dispersion) interaction ?

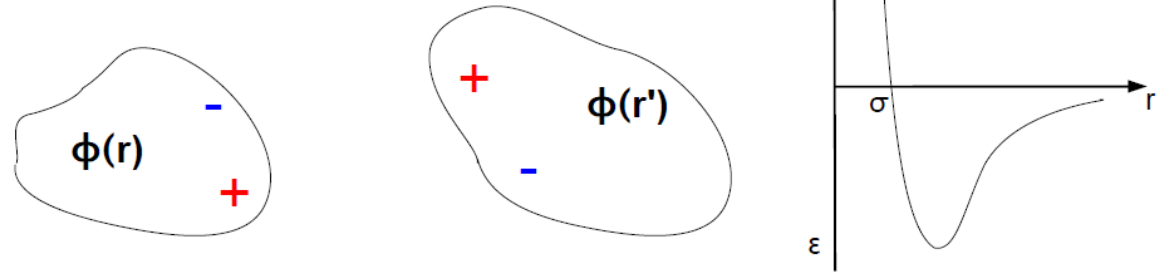


Application - Modeling of Polymer Interfacial Systems: Polymer/Metal Interfaces

- (2) Is a LJ type of potential a good approximation ?

van der Waals / dispersion forces

Long range electron correlation



Instantaneous dipole moment *induces* a dipole moment
Dipole-dipole interaction $\sim r^{-6}$

❑ Answers:

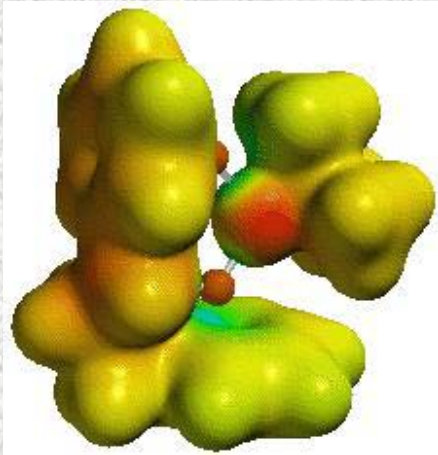
- (1) Molecule/Metal interaction **cannot be estimated analytically.**
- (2) We do not know if LJ potential is a good approximation.



❑ Idea: Use **DFT calculations** of a single molecule adsorbed onto the metal surface.

Modeling Complex Hybrid Systems: (A) Ab-initio Calculations

- Description of the system in the most detailed (**quantum**) level.



Time-independent Schrodinger equation

$$\hat{H} \Psi = [T + V] \Psi = E \Psi$$

↑
Hamiltonian
operator

↑
total
energy

↑
many-body
wavefunction

$$T = -\frac{\hbar^2}{2m} \nabla^2 \quad \text{is the kinetic energy (momentum)}$$

V is the potential energy

✓ Difficult to solve Schrodinger's equation for **many-body system**:



Density Functional Theory: Hohenberg – Kohn – Sham

□ Electronic wavefunction \rightarrow electron density $\rho(r) = \sum_{i=1}^N |\phi_i^2(r)|$

➤ Solve N independent Kohn Sham equations iteratively:

$$[T_s + V_s] \phi_i = \varepsilon_i \phi_i$$

$$V_s = \frac{1}{2} \int \frac{\rho(r')}{|r - r'|} d^3 r' + V_{XC}(r) + V_{ext}$$

Coulomb
energy

Exchange and
Correlation

External
potential due to
nuclei

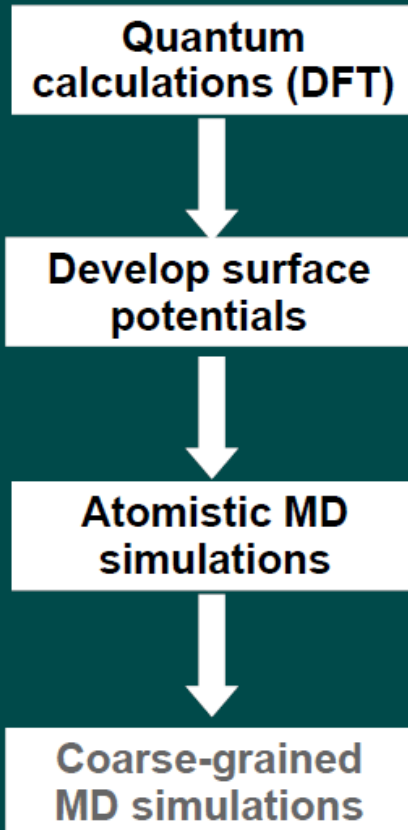
➤ Exchange and Correlation is the main approximation in DFT.

□ For more information see for example: Electronic Structure by R.M. Martin

□ Exchange and Correlation Functional

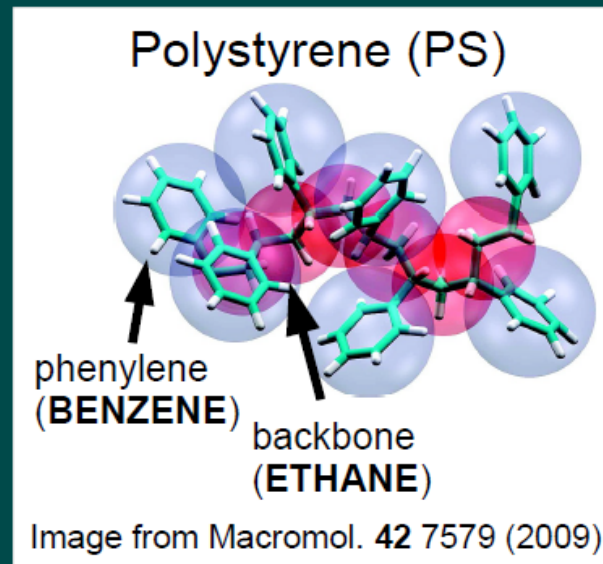
- **Local density approximation (LDA):**
Based on “jellium”(homogeneous electron gas)
- **Generalized gradient approximation (GGA):**
Includes a gradient term in the electron density
Several GGA functionals, e.g. PW91, PBE, revPBE
- **Hybrid:**
Combination of Hartree-Fock and DFT XC functional
→ empirical coupling parameter
Several functionals, e.g. BLYP, B3LYP
- **van der Waals:**
Long range correlation not in standard DFT

Hierarchical multiscale modelling



Develop atomistic surface potentials

- Assume PS = benzene + ethane
- DFT adsorption energy vs. distance from surface for several molecular orientations
- Fit classical pair potentials to DFT data



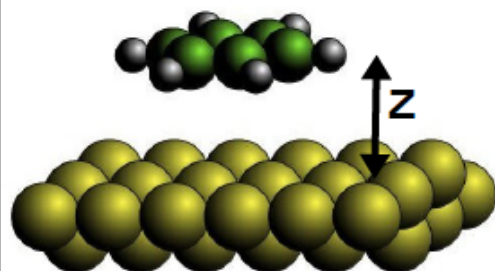
Molecule/Surface Interaction

- Customised VASP code
- DFT + vdW-DF using PBE exchange [1,2]
- Adsorption is due to vdW forces

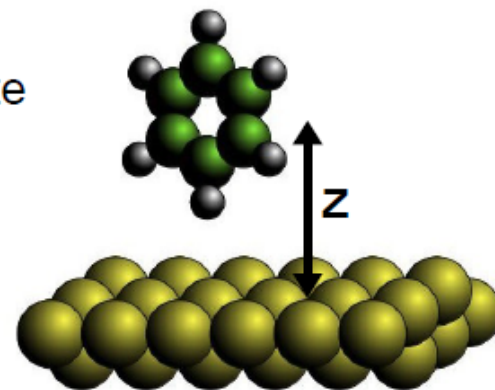
$E_{\text{adsorption}}$ (kJ/mol)	
Present [3]	82.1
Ref [4]	77.2
DFT+D [5]	73.3
Expt TDS [6]	61.8

- [1] Dion PRL 92 (2004)
- [2] Gulans PRB 79 (2009)
- [3] Johnston JPCC 115 (2011)
- [4] McNellis PRB 80 (2009)
- [5] Tonigold JCP 132 (2010)
- [6] Syomin JPC 105 (2001)

Lowest energy structure:
Benzene flat on hollow site



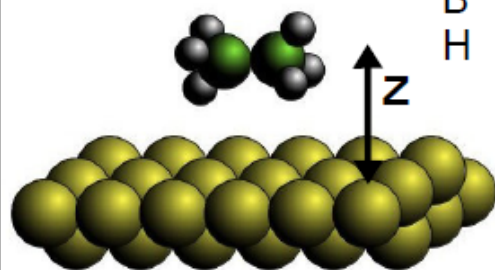
Benzene flat



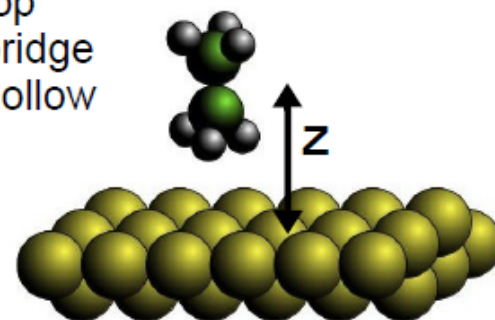
Benzene vertical

Sites:

- T top
- B bridge
- H hollow



Ethane flat

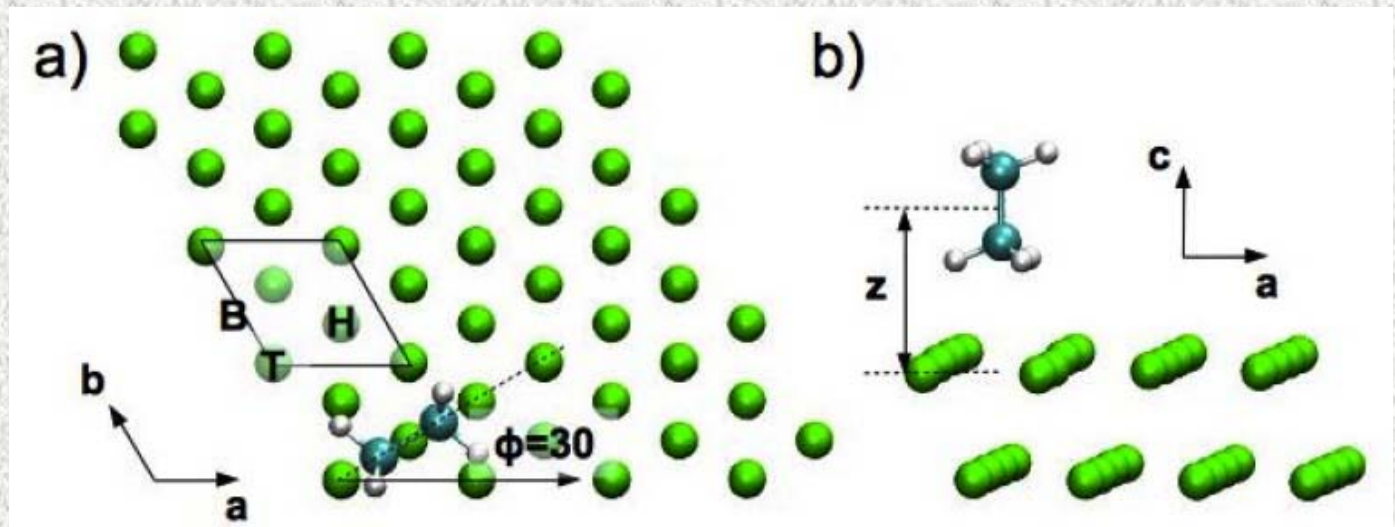


Ethane vertical

Benzene/Au systems: Density Functional Theory

□ Adsorption **sites, angles, distances and energy** for a single benzene, ethane molecule:

Site	Angle ($^{\circ}$)	z (\AA)	E_{ads} (kJ mol^{-1})	Method
T	0	3.34	74.9	vdW-DF
B	30	3.22	81.0	vdW-DF
H	30	3.22	82.1	vdW-DF
H	30	3.25	77.2	TS ³⁶
H	–	3.6	73.3	DFT+D ¹⁷
–	–	–	61.8	TPD ³⁸



Polymer/Metal Interfaces: From Ab-initio to Atomistic Scale

- ❑ DFT calculations can be used for modeling the interaction of a **few atoms** with the solid surface.
- ❑ We need to **“built a bridge”** between ab-initio and classical simulations.

Important question: How do we **parameterize DFT data** (energies) in order to obtain an accurate microscopic (**atomistic**) interaction potential?

$$E_{ads}^{DFT}$$

- ❑ For **N polymer atoms** interacting with **M surface atoms** we have:

$$E_{ads}^{AT} = \sum_{i=1}^N \sum_{j=1}^M V(r_{ij})$$

➤ $V(r_{ij})$ is the pair classical non-bonded potential (usually Lennard-Jones type).

- ❑ Require: **Optimization over many parameter space**, i.e. a highly complex numerical problem.



Polymer/Metal Interfaces: Parameterization of DFT Calculations

[K. Johnston and VH, J. Phys. Chem. C, 115, 1407 (2011)]

□ **Idea:** Use a **Simulated Annealing** code.

✓ Parameters of the non-bonded interaction are chosen in order to minimize a cost function.

✓ **Cost function** is defined as the difference between atomistic and DFT obtained polymer/metal interaction energy.

$$F = \sum_{i=1}^{n_{\text{confs}}} \sum_{j=1}^{n_k} \left[\left(E_{\text{ads}}^{\text{DFT}}(i, z_j) - E_{\text{ads}}^{\text{AT}}(i, z_j) \right)^2 W(i, z_j) \right]$$

-- n_{confs} : number of molecule conformations.

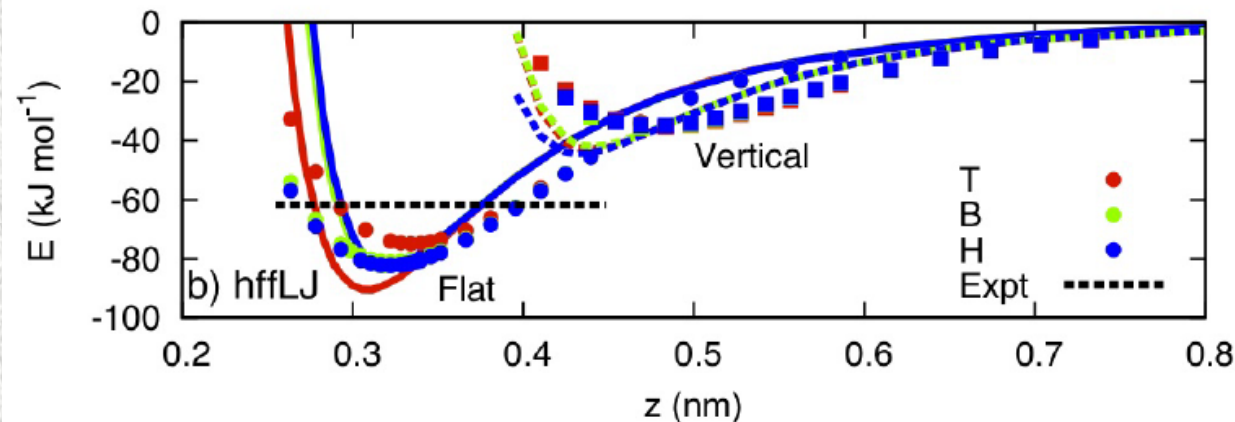
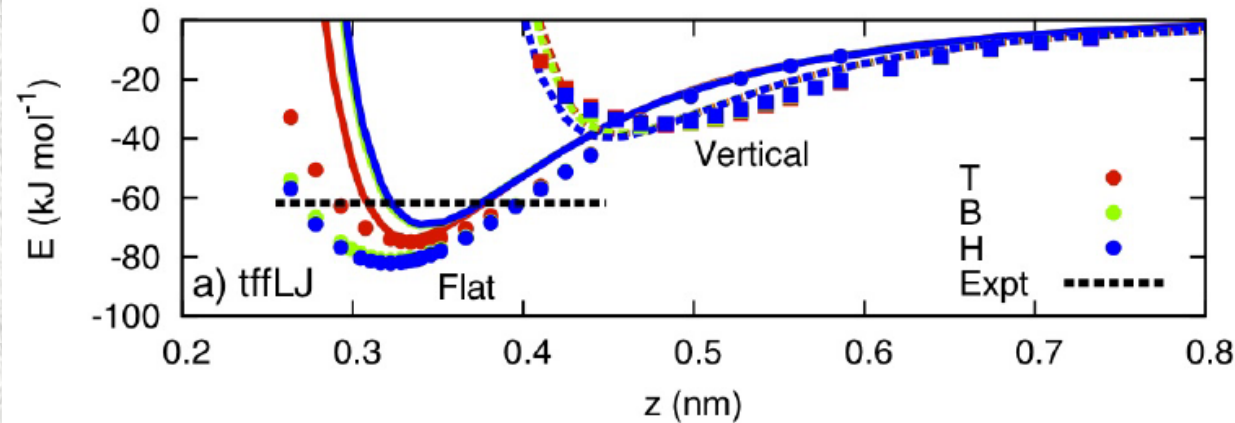
-- n_k : number of molecule-surface distances (z_j) for each conformation.

-- $W(i, z_j)$: statistical weights.

Polymer/Metal Interfaces: Parameterization of DFT data using a SA code

➤ **Benzene/Au** interaction - use a typical **LJ** atomistic potential:

$$V_{LJ}(r_{ij}) = 4\epsilon_{ij} \left[\left(\frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left(\frac{\sigma_{ij}}{r_{ij}} \right)^6 \right]$$

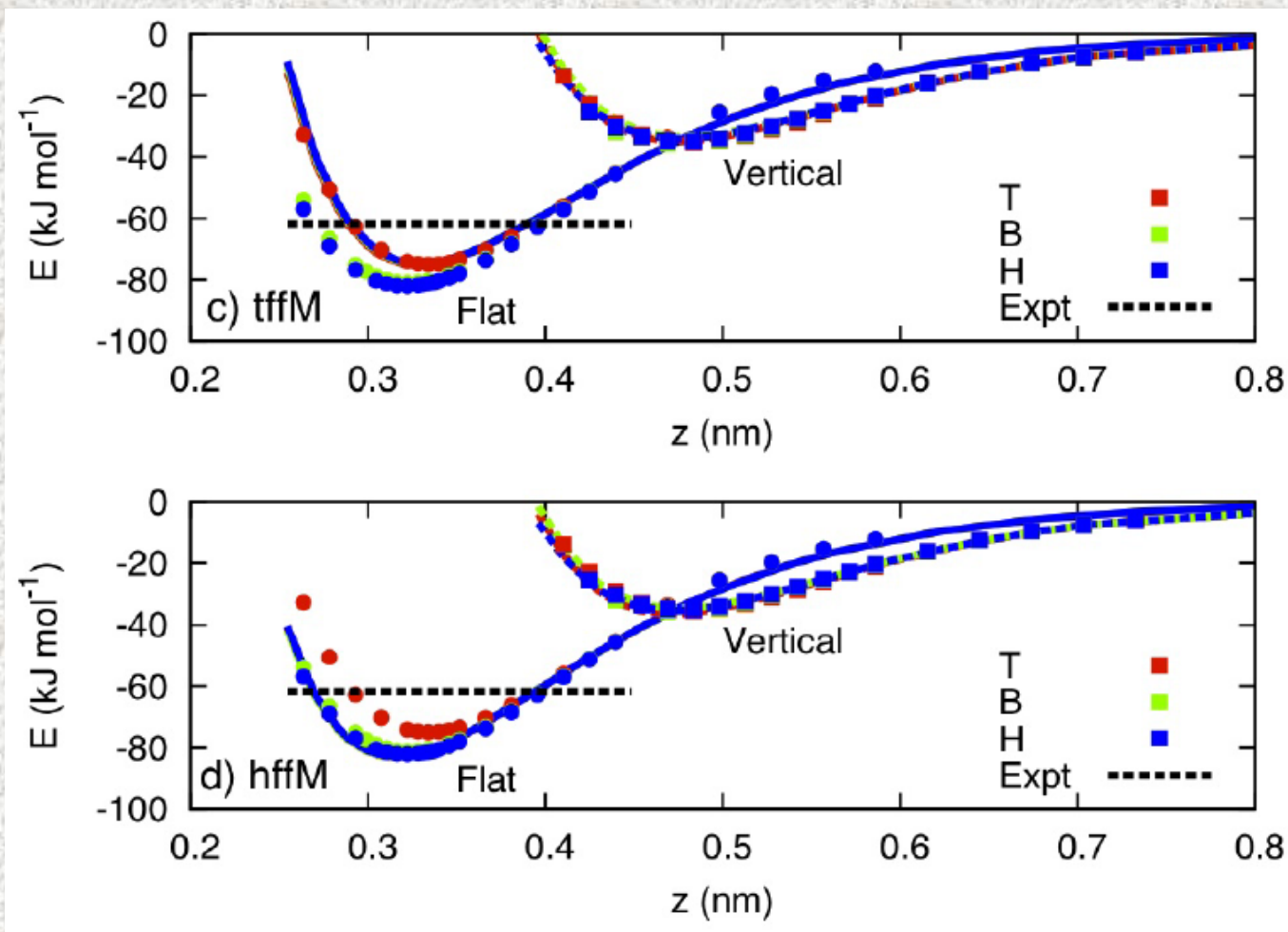


❑ LJ Potential (**lines**) is **NOT** a good choice for a proper description of molecule/metal DFT interaction potential (**symbols**).

Polymer/Metal Interfaces: Parameterization of DFT data using a SA code

➤ **Benzene/Au** interaction - use a more detailed **Morse** potential:

$$V_{LJ}(r_{ij}) = \varepsilon_{ij} \left[\exp\left(-2\alpha_{ij}(r_{ij} - r_{0,ij})\right) - 2\exp\left(-\alpha_{ij}(r_{ij} - r_{0,ij})\right) \right]$$

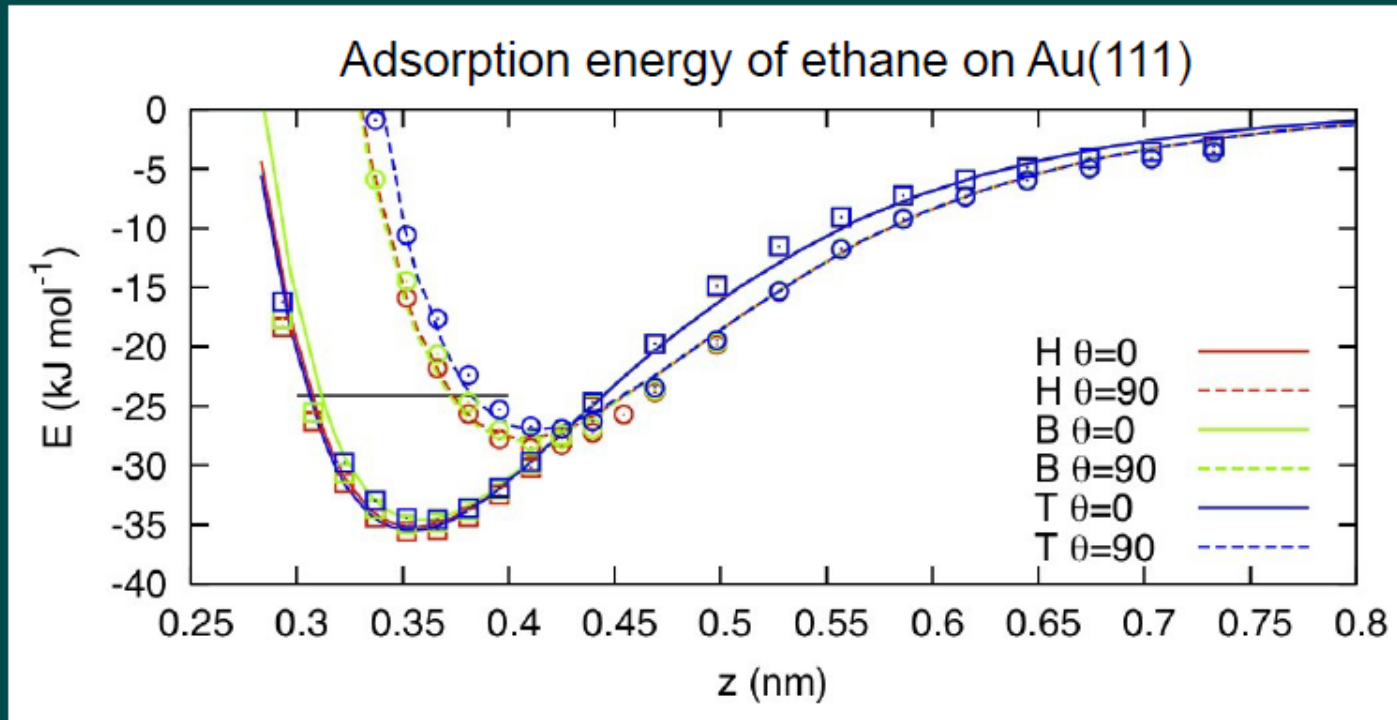


Very good agreement between DFT and Atomistic data at all distances!

Polymer/Metal Interfaces: Parameterization of DFT data using a SA code

➤ **Ethylene/Au** interaction - **Morse** potential: $V_{LJ}(r_{ij}) = \epsilon_{ij} \left[\exp(-2\alpha_{ij}(r_{ij} - r_{0,ij})) - 2 \exp(-\alpha_{ij}(r_{ij} - r_{0,ij})) \right]$

Adsorption energy vs distance for various sites/orientations



- vdW dominated interaction
- Adsorption much weaker than benzene
- Morse potential is good fit to DFT data

Polymer/Metal Interfaces: New Atomistic Force Field

➤ **Results:** New atomistic force field for PS/Au systems using Morse potential.

[K. Johnston and VH, J. Phys. Chem. C, 115, 1407 (2011); Soft Matter 8, 6320 2012]

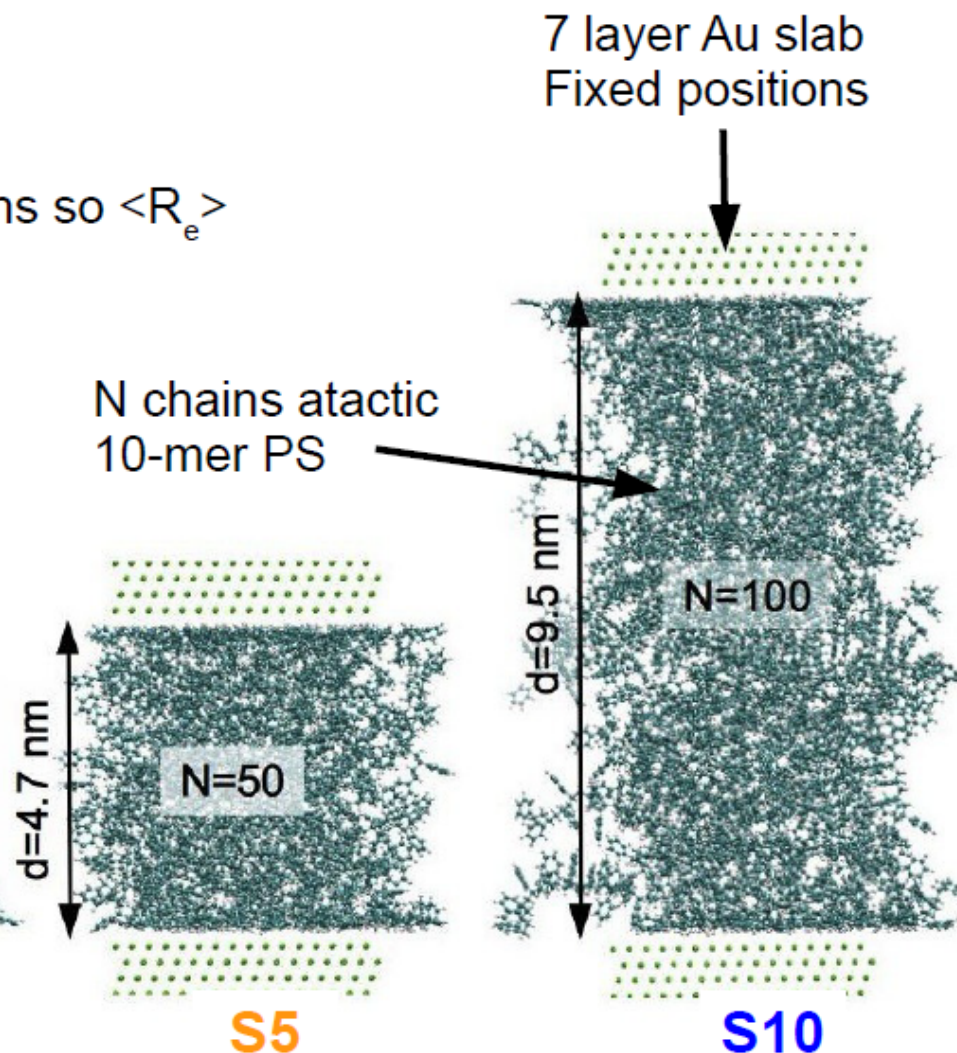
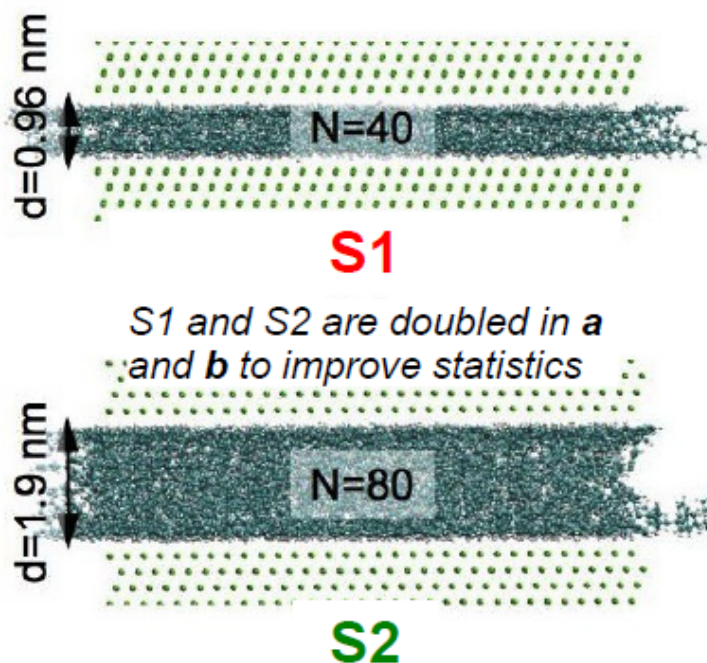
$$V_{LJ}(r_{ij}) = \varepsilon_{ij} \left[\exp\left(-2\alpha_{ij}(r_{ij} - r_{0,ij})\right) - 2\exp\left(-\alpha_{ij}(r_{ij} - r_{0,ij})\right) \right]$$

Type	Atom pair	σ/r_0 (Å)	ε (kJ/mol)	α (nm ⁻¹)
LJ	Au-C _{ethyl}	0.37	1.95	-
LJ	Au-H _{ethyl}	0.25	0.16	-
Morse	Au-C _{ethyl}	0.42	0.95	12.06
Morse	Au-H _{ethyl}	0.38	0.42	9.74
Morse	Au-C _{phenyl}	0.41	0.93	10.14
Morse	Au-H _{phenyl}	0.40	0.31	11.66

❑ Excellent agreement between DFT and atomistic data, using a Morse potential, at all distances, adsorption sites and orientations.

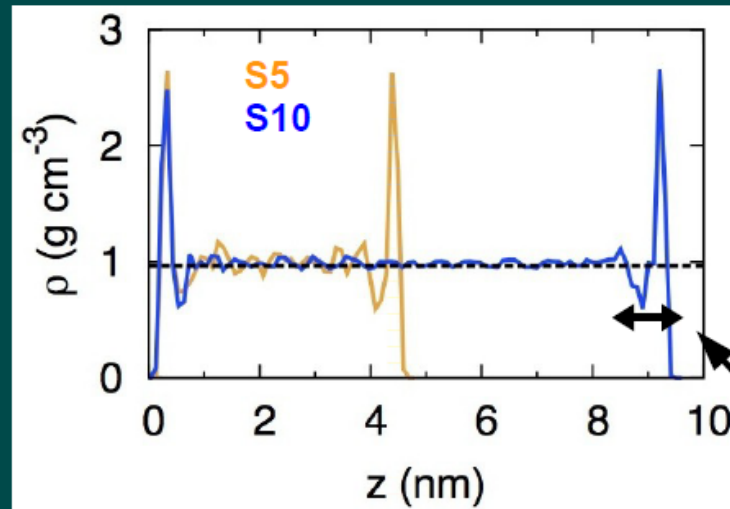
Hybrid Polystyrene/Au Systems: Atomistic Model Systems

- GROMACS 4.0
- Periodic boundary conditions
- NpT, T=503 K
- Equilibration at high T for 10 ns so $\langle R_e \rangle$ decorrelates
- 50 chains used for bulk (B)



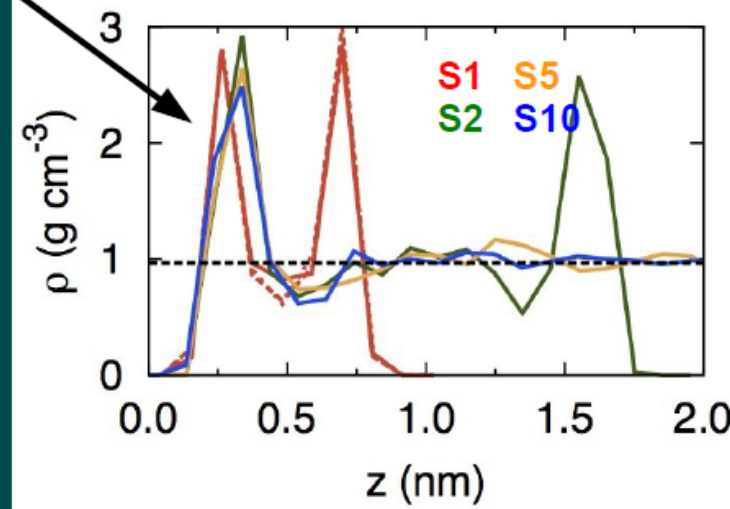
Hybrid Polystyrene/Au Systems: Density - Structure

Density profiles



Single peak at surface (adsorption layer)

Film reaches bulk density ≈ 1.5 nm from surface

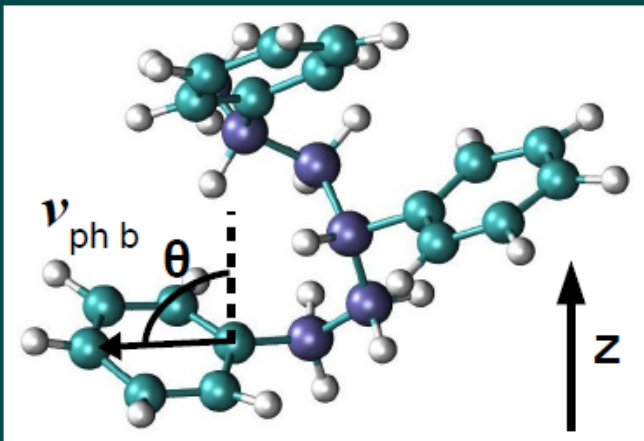


Hybrid Polystyrene/Au Systems: Structure

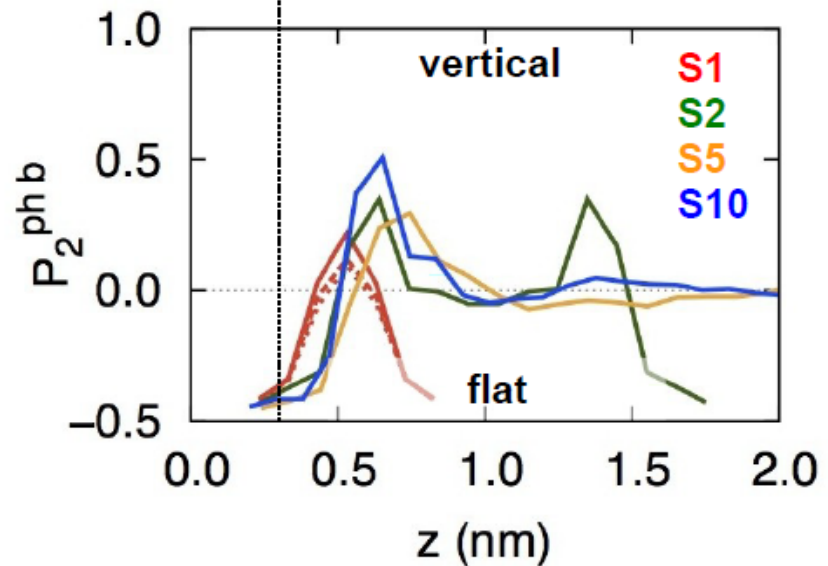
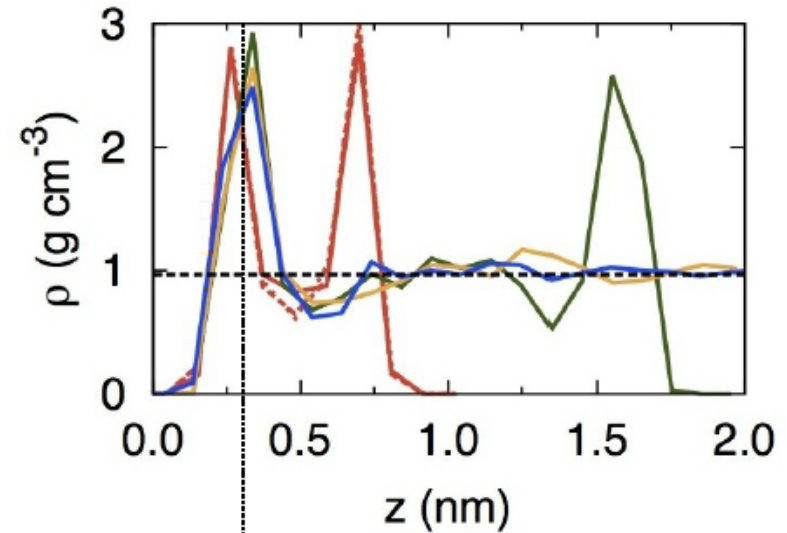
Structure – Orientation parameter P_2

$$P_2 = \frac{3}{2} \langle \cos^2(\theta) \rangle - \frac{1}{2}$$

= +1.0 perpendicular
-0.5 parallel



Phenyl rings in adsorption layers align parallel to surface

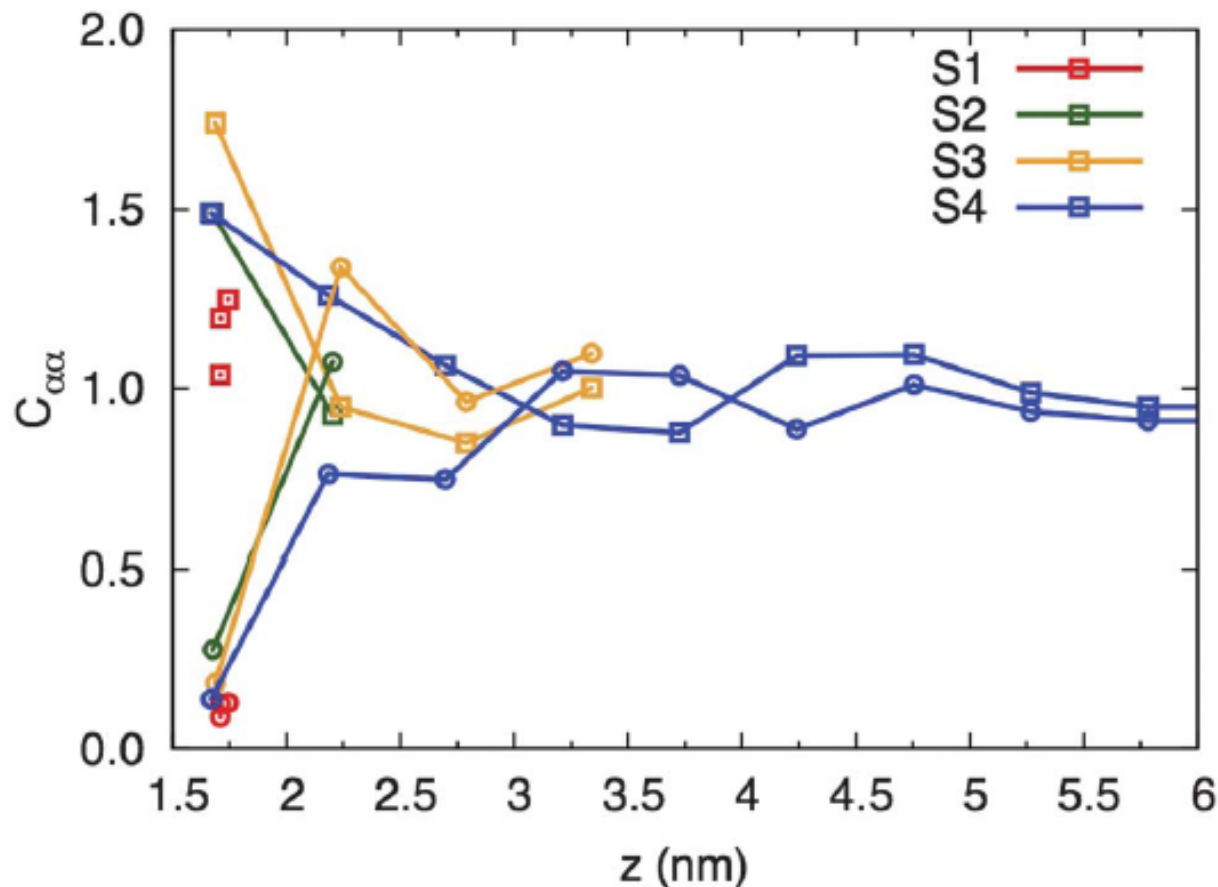
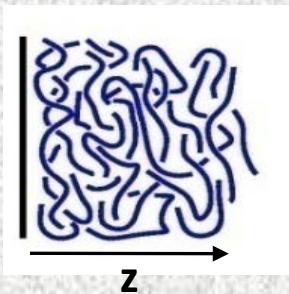


Polystyrene/Au Interfaces: Conformation Tensor

[K. Johnston and VH, Soft Matter 8, 6320 (2012)]

$$C_{\alpha\beta} = \frac{\langle R_\alpha \cdot R_\beta \rangle}{3 \langle R^2 \rangle_{eq}}$$

➤ Bulk: $C_{xx} = C_{yy} = C_{zz} = 1$

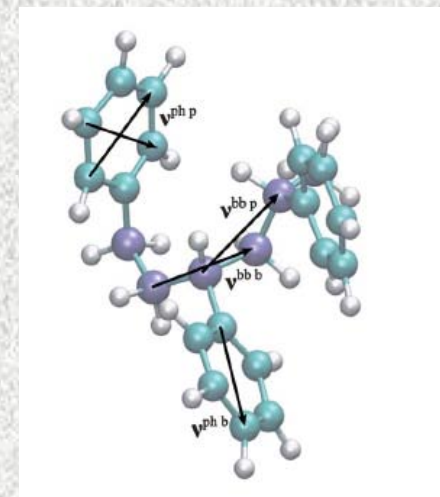
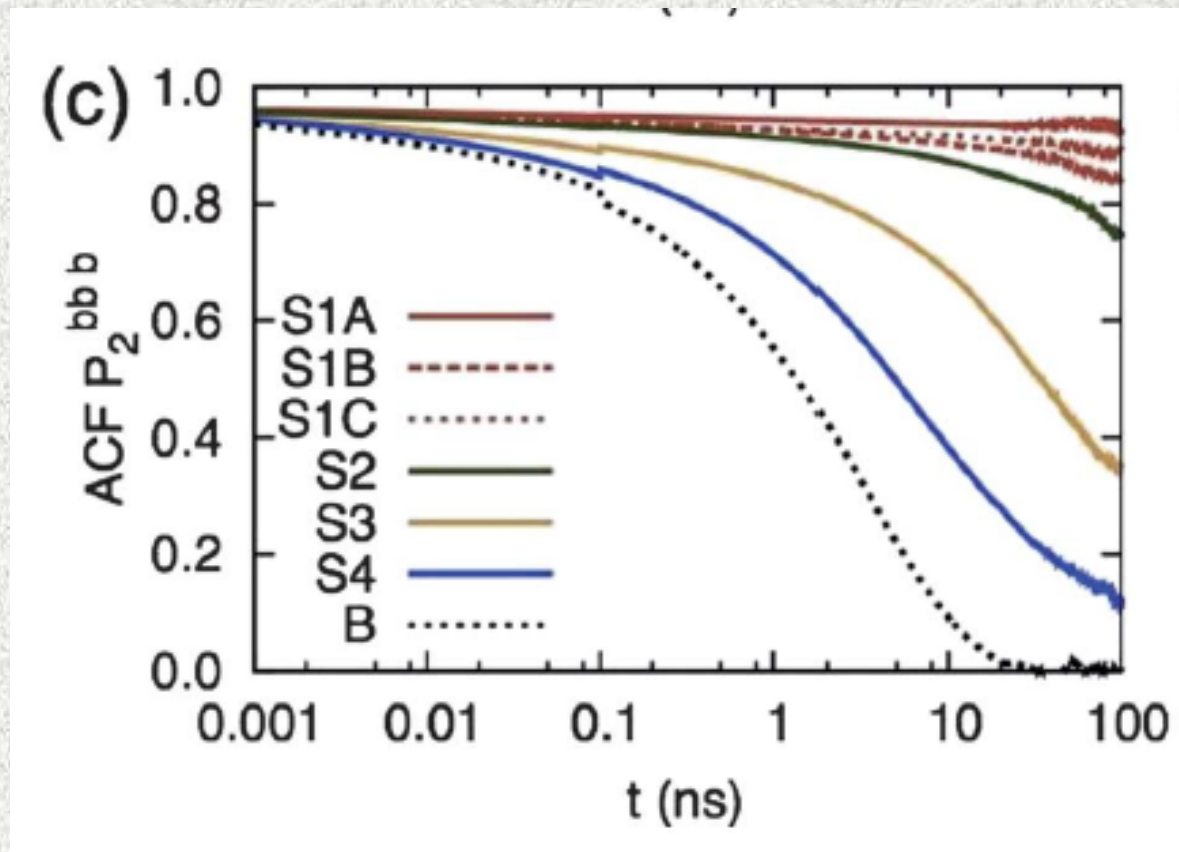


➤ (squares) $(C_{xx} + C_{yy})/2 > 1$ for distances < 3 nm from the Au substrate

➤ (circles) $C_{zz} < 1$ for distances $< 3-4$ nm from the Au substrate

PS Local Dynamics as a function of distance from the Au surface

Local dynamics of different vectors along the monomer



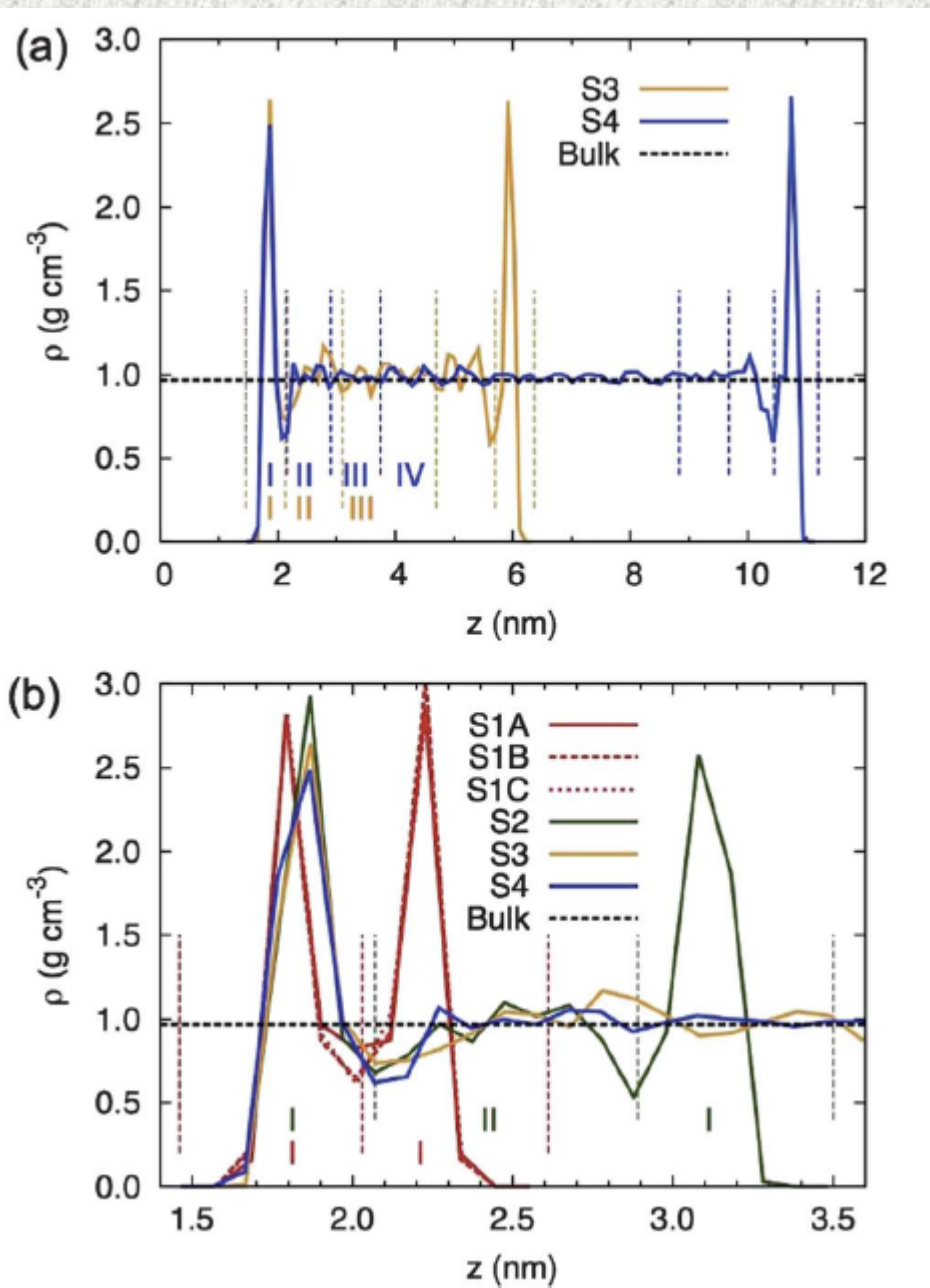
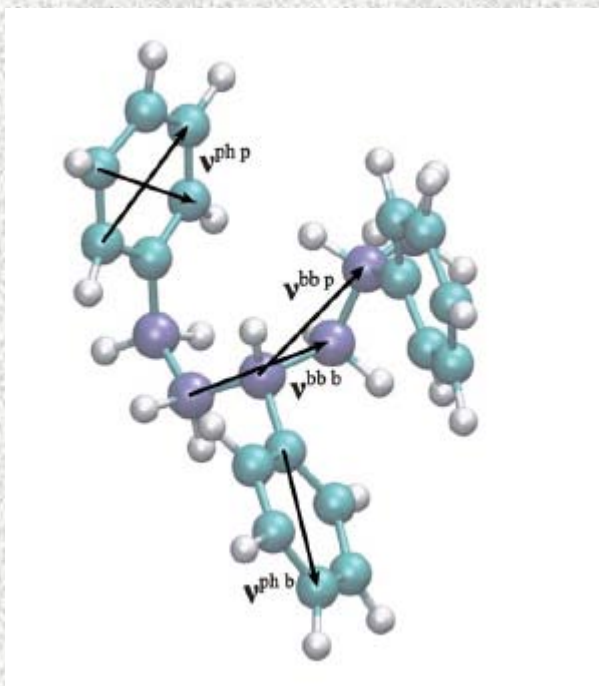
$$P_2(t) = \frac{1}{2} \left(3 \langle \cos^2(\theta(t)) \rangle - 1 \right)$$

$P_2(t)$ can be fitted with stretched exponential functions:

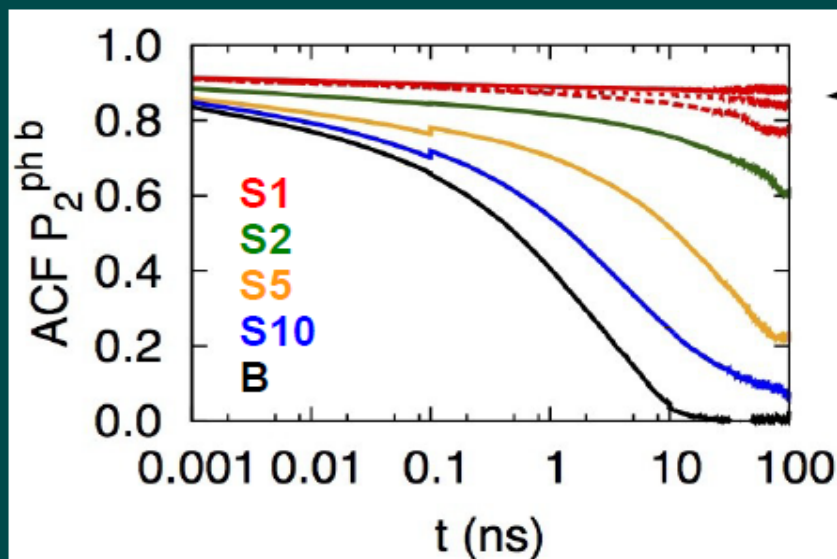
$$P_2(t) = A \exp \left\{ - \left(\frac{t}{t_{KWW}} \right)^\beta \right\}$$

Polystyrene/Au Systems: Analysis as a function of distance from the Au surface

□ Define adsorption layers I - IV

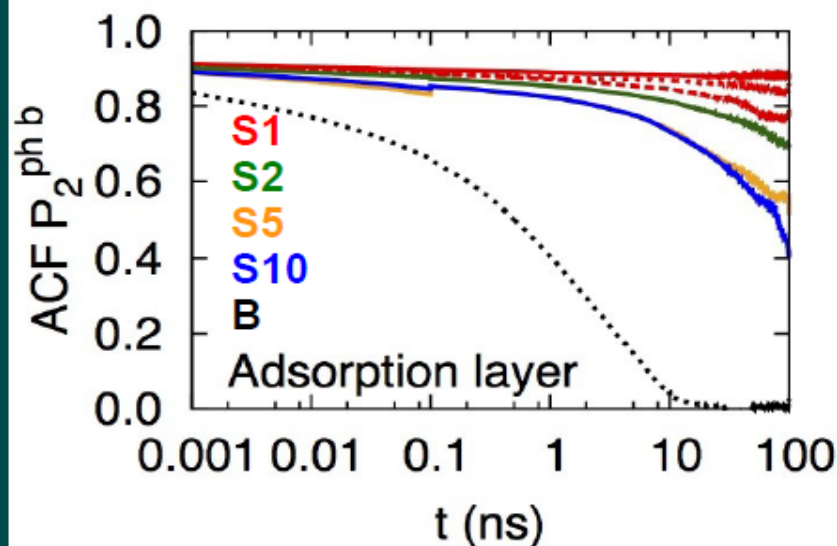


Dynamics – Time autocorrelation function for P2



S1 films
almost frozen

Confinement
increases
decorrelation
time



Dynamics slowest
in adsorption layer

Similar trend in
mean square
displacements

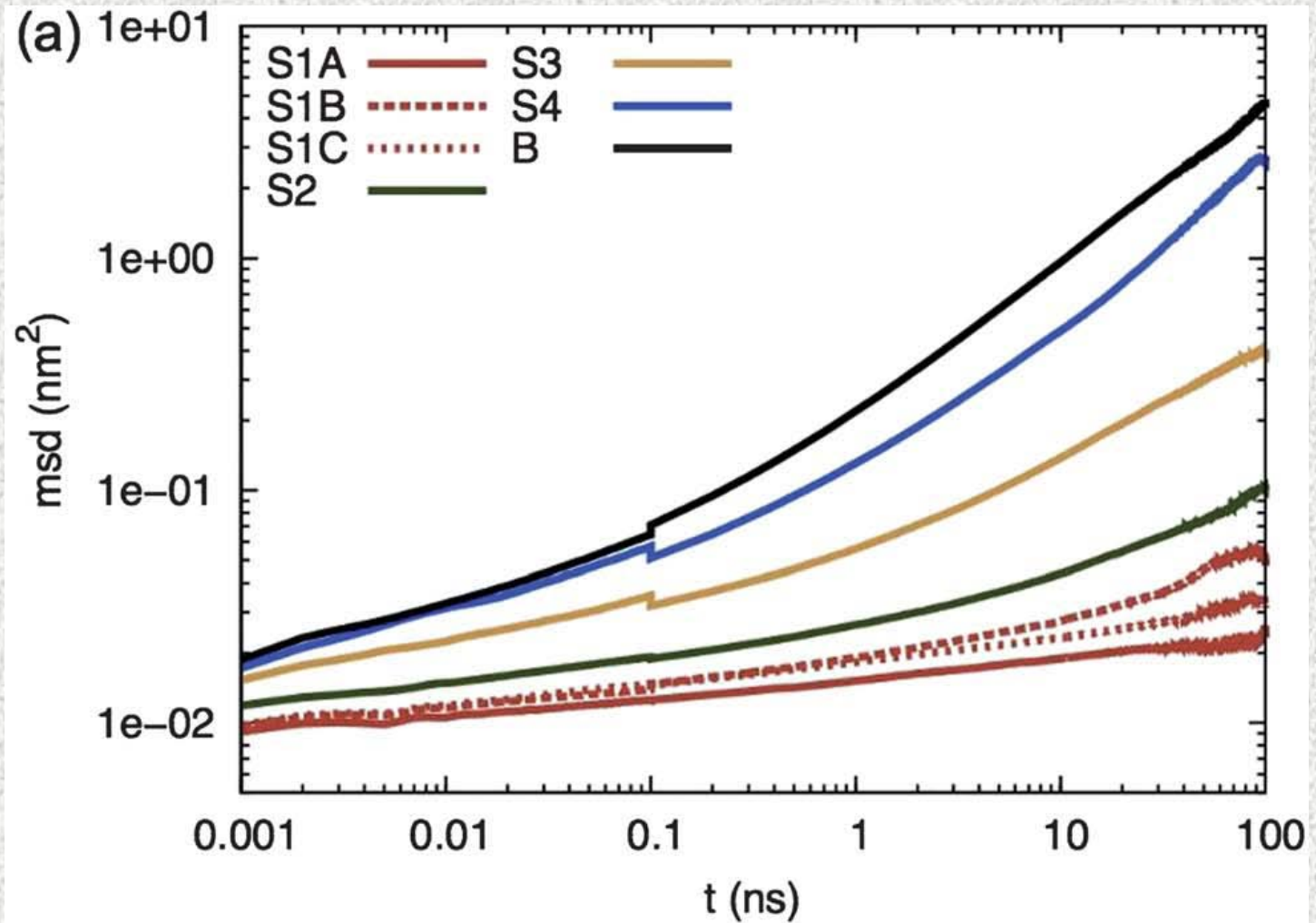
PS Local Dynamics as a function of distance from the Au surface

□ Segmental relaxation times (ns) and stretching exponents of PS molecules for different adsorption layers.

Film	Region	$\nu^{\text{ph p}}$		$\nu^{\text{ph b}}$		$\nu^{\text{bb b}}$	
		t_{KWW}	β	t_{KWW}	β	t_{KWW}	β
S1A	I	$\sim 7 \times 10^4$	0.20	$\sim 10^7$	0.27	$> 10^8$	0.27
S1B	I	$\sim 2 \times 10^4$	0.22	$\sim 10^7$	0.26	$> 10^8$	0.25
S1C	I	$\sim 3 \times 10^4$	0.25	$\sim 10^7$	0.27	$> 10^8$	0.28
S2	I	350.0	0.29	3.0×10^3	0.35	6.0×10^3	0.40
S2	II	200.0	0.30	0.7×10^3	0.35	2.0×10^3	0.40
S3	I	105.0	0.30	600.0	0.36	10^3	0.50
S3	II	18.5	0.35	29.0	0.44	64.0	0.55
S3	III	7.0	0.40	11.0	0.48	25.0	0.58
S4	I	35.0	0.36	100.0	0.40	620.0	0.53
S4	II	5.5	0.38	20.0	0.40	40.0	0.58
S4	III	3.2	0.47	4.3	0.48	9.0	0.57
S4	IV	1.8	0.52	2.2	0.55	4.8	0.60
B		0.9	0.50	1.6	0.60	2.5	0.61

Polymer/Metal Interfaces: Chain Center-of-mass Dynamics

[K. Johnston and VH, Soft Matter 8, 6320 (2012)]

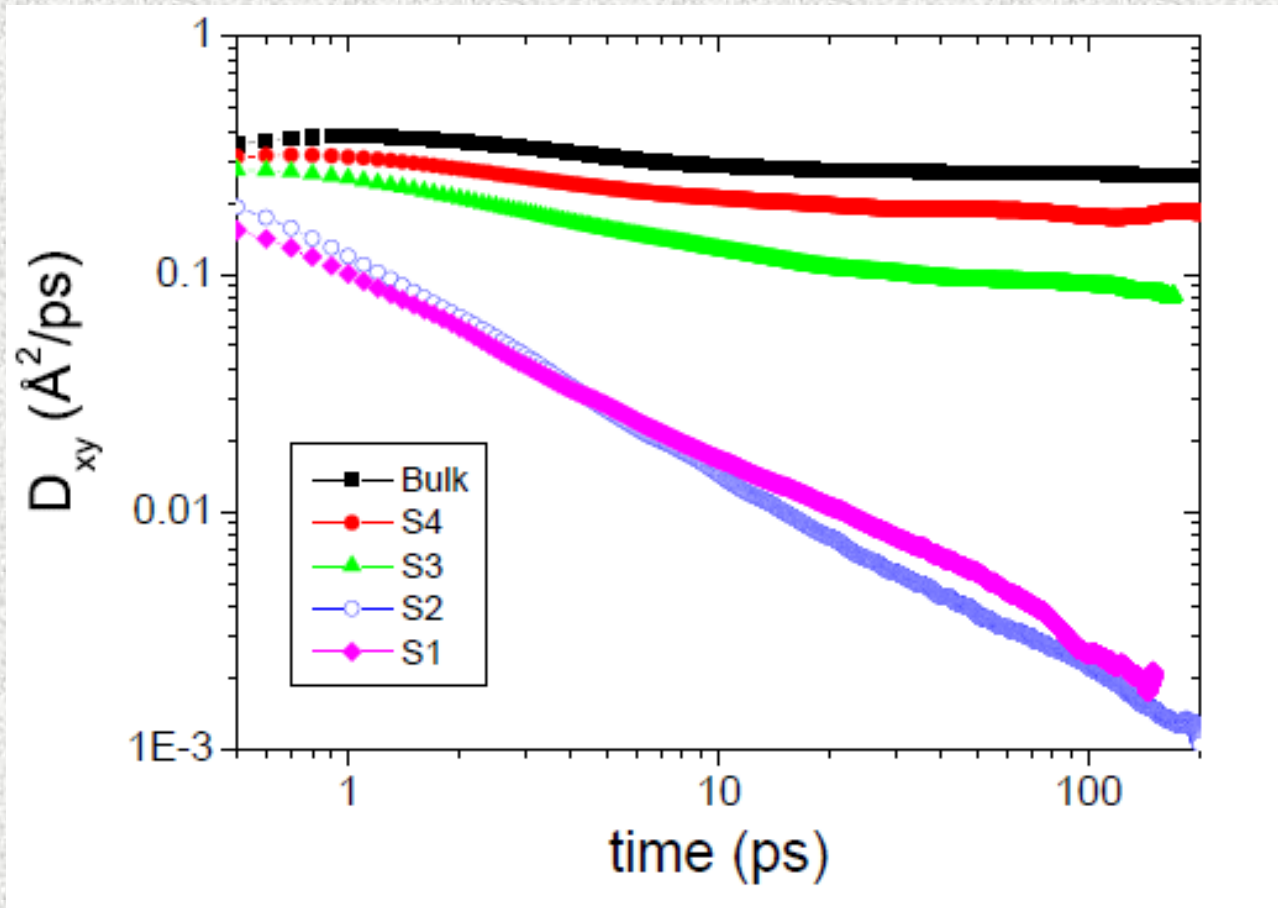


☐ Strongly confined systems : practically frozen.


Polymer/Metal Interfaces: Chain Center-of-mass Dynamics

□ Define effective diffusivity in the xy plane:

$$D \equiv D(z,t) = \frac{\langle (R_{cm}(t) - R_{cm}(0))^2 \rangle}{6t}$$



Current Work: (C) Realistic Polymer Nanocomposites

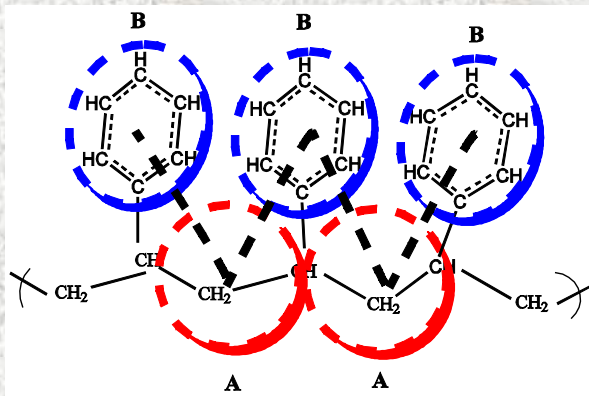
- Polymer/solid interfaces are models of a **single nanoparticle** embedded in a polymer matrix.
- Full study of **realistic nanocomposites** requires modeling of huge systems. 

Mesoscopic (**coarse-grained, CG**) models of nanocomposites, based on:

CG Polymer models developed directly from the chemistry

[Harmandaris, et al. Macromolecules, 39, 6708 (2006); Macromol. Chem. Phys. 208, 2109 (2007); Macromolecules 40, 7026 (2007)]

- Example CG PS 2:1 model: Each chemical repeat unit replaced by two spherical beads (PS: 16 atoms or 8 “united atoms” replaced by 2 beads).



- **CG operator T**: from “CH_x” to “A” and “B” description.

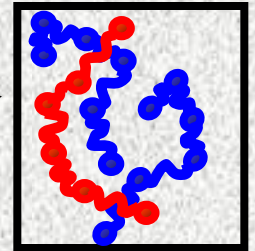
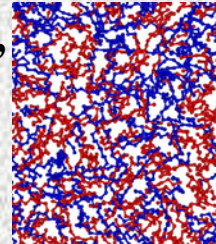
$$\sigma_A = 4.25 \text{ \AA}, \quad \sigma_B = 5.10 \text{ \AA}$$

- **Chain tacticity** is described through the effective CG potentials.
- **Possible to re-introduce atomistic detail if needed.**

GENERAL PROCEDURE FOR DEVELOPING MESOSCOPIC PARTICLE MODELS DIRECTLY FROM THE CHEMISTRY

1. Choice of the proper **mesoscopic description**.

-- number of atoms that correspond to a 'super-atom'
(coarse grained bead)



2. Microscopic (atomistic) simulations of short chains (oligomers) for short times.

3. Develop the effective **mesoscopic force field** using the atomistic data.

4. CG (MD or MC) simulations with the new **CG** model.

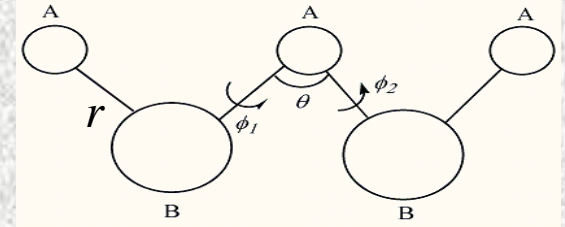
Re-introduction (**back-mapping**) of the atomistic detail if needed.

DEVELOP THE EFFECTIVE MESOSCOPIC CG POLYMER FORCE FIELD

$$U_{total}^{CG}(\mathbf{Q}) = U_{bonded}^{CG}(\mathbf{Q}) + U_{non-bonded}^{CG}(\mathbf{Q})$$

BONDED POTENTIAL

- **Degrees of freedom:** bond lengths (r), bond angles (θ), dihedral angles (ϕ)



PROCEDURE:

- From the microscopic simulations we calculate the **distribution functions** of the degrees of freedom in the mesoscopic representation, $P^{CG}(r, \theta, \phi)$.

- $P^{CG}(r, \theta, \phi)$ follow a Boltzmann distribution:

$$P^{CG}(r, \theta, \phi) = \exp \left[-\frac{U^{CG}(r, \theta, \phi)}{kT} \right]$$

- Assumption:

$$P^{CG}(r, \theta, \phi) = P^{CG}(r) P^{CG}(\theta) P^{CG}(\phi)$$

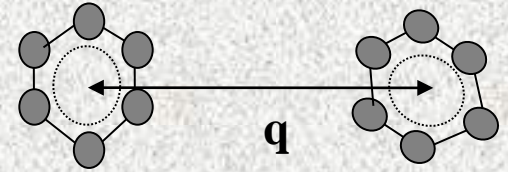
- Finally:

$$U^{CG}(x, T) = -k_B T \ln P^{CG}(x, T), \quad (x = r, \theta, \phi)$$

NONBONDED INTERACTION PARAMETERS: REVERSIBLE WORK

➤ CG Hamiltonian – Renormalization Group Map:

$$e^{-\beta U_{nb}^{CG}(\mathbf{q}, T)} = \int e^{-\beta U^{AT}(\mathbf{r}, T)} P_N(d\mathbf{r} | \mathbf{q})$$



Reversible work method [McCoy and Curro, *Macromolecules*, 31, 9362 (1998)]

➤ By calculating the reversible work (**potential of mean force**) between the centers of mass of **two isolated** molecules as a function of distance:

$$e^{-\beta U_{nb}^{CG}(\mathbf{q}, T)} = \frac{\int \dots \int \exp[-\beta U^{AT}(\mathbf{r}, T)] d\mathbf{r}_1, \dots, \mathbf{r}_N}{Z_N}$$

$$\beta U_{nb}^{CG}(\mathbf{q}, T) = -\ln \left\langle \exp(-\beta U^{AT}(\mathbf{r}, \Gamma)) \right\rangle \quad U^{AT}(\mathbf{r}, \Gamma) = \sum_{i,j} U^{AT}(\mathbf{r}_{ij})$$

➤ Average $\langle \rangle$ over all **degrees of freedom Γ that are integrated out** (here orientational) keeping the two center-of-masses fixed at distance r .

NONBONDED INTERACTION PARAMETERS: REVERSIBLE WORK

➤ Calculate “**reversible work**” using a numerical method (eg. MC or MD).

➤ Assumptions:

(A) **Neglect many-body effect.** Exact for the gas phase.

(B) **Chain effect is not described.** In our case CG particles belong to a macromolecule.

Solution: Use of conditional reversible work
[Fritz et al, 2009]

➤ Main idea: Use instead two very short chains and keep constant the distance between the center-of-mass of **only** the two target CG (e.g. 1, 2) particles.

(A) Calculate the **PMF** including **all atomistic** interactions, $V_{PMF}^{1-2}(\mathbf{q}, T)$

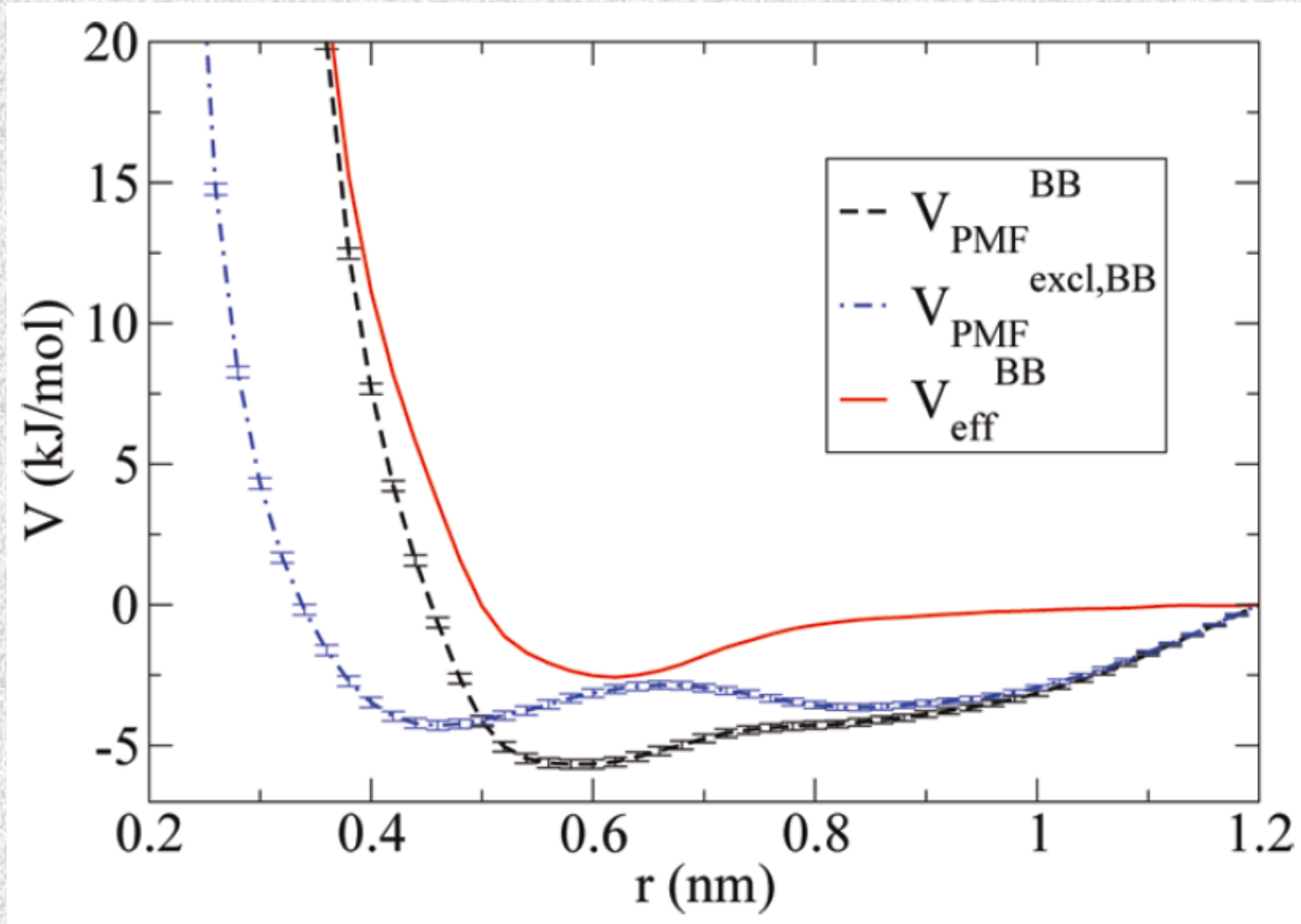
(B) Calculate the **PMF** with all atomistic interactions **excluding the A-B ones.** $V_{PMF}^{1-2, Excl}(\mathbf{q}, T)$

❑ **Effective CG interaction is:**

$$U_{nb}^{CG,1-2}(\mathbf{q}, T) = V_{PMF}^{1-2}(\mathbf{q}, T) - V_{PMF}^{1-2, Excl}(\mathbf{q}, T)$$

CG NONBONDED EFFECTIVE INTERACTION POTENTIAL

➤ CG effective potential calculated by the reversible work method using short chains.



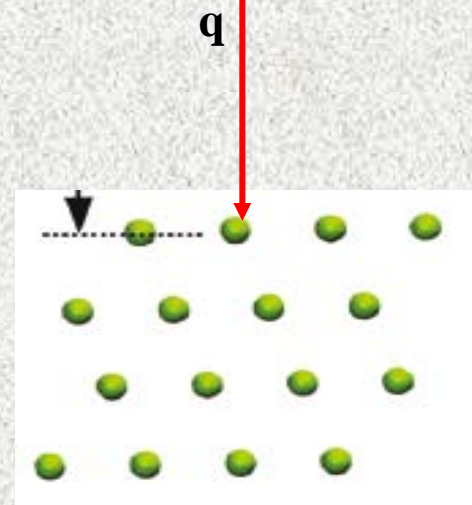
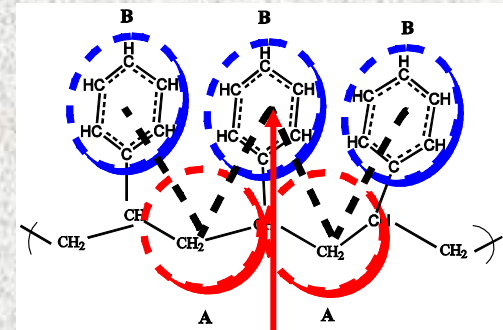
Polymer/Metal Interfaces: Coarse-Grained Model

$$U_{total}^{CG}(\mathbf{Q}) = U_{bonded}^{CG}(\mathbf{Q}) + U_{non-bonded}^{CG}(\mathbf{Q}) + U_{superatom/surface}^{CG}(\mathbf{Q})$$

□ We need the CG superatom / Au surface interaction potential (free energy) .

➤ Develop it as a PMF between molecule and surface:

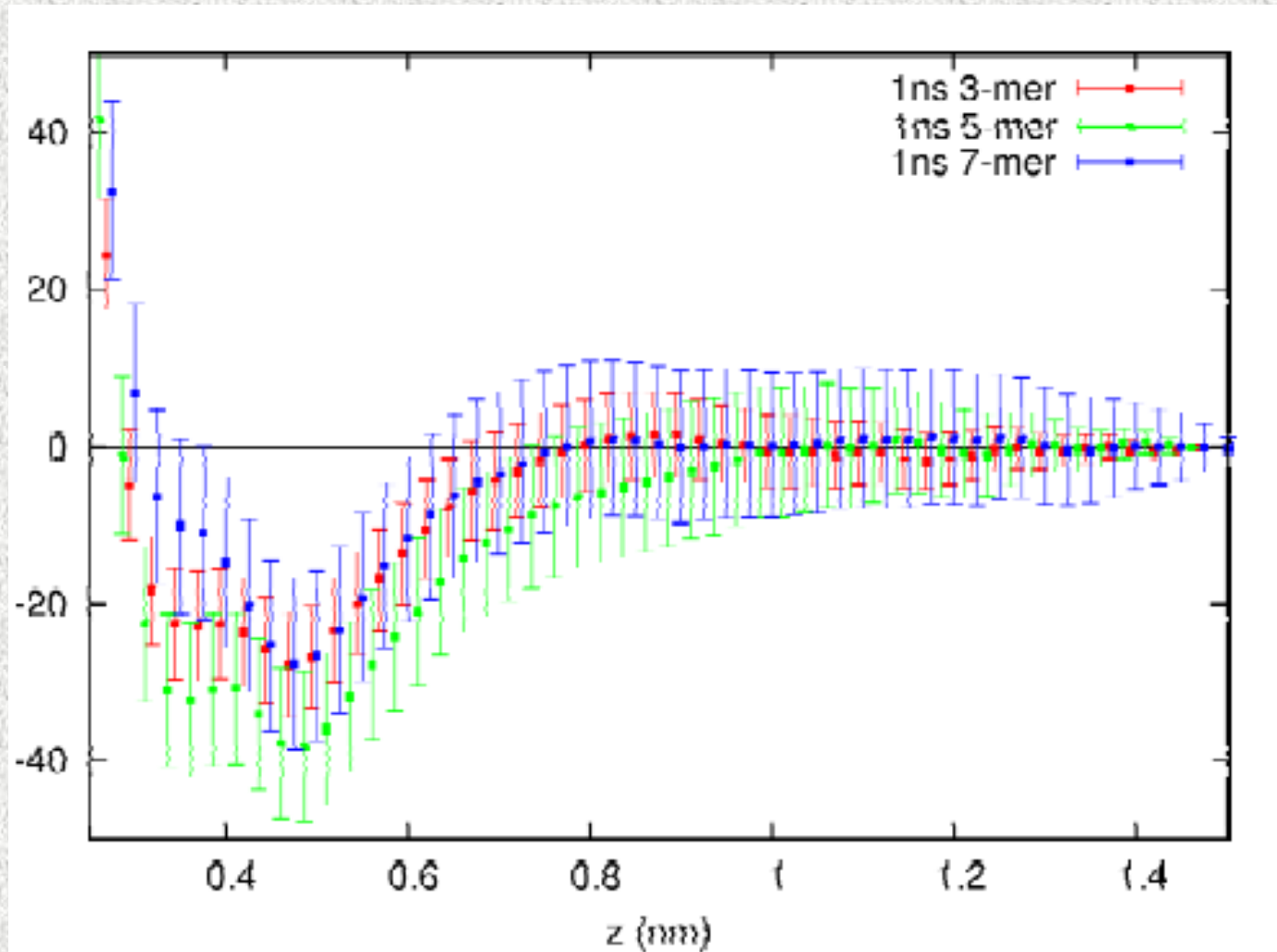
$$U_{superatom/surface}^{CG}(\mathbf{q})$$



Polymer/Metal Interfaces: Coarse-Grained Model

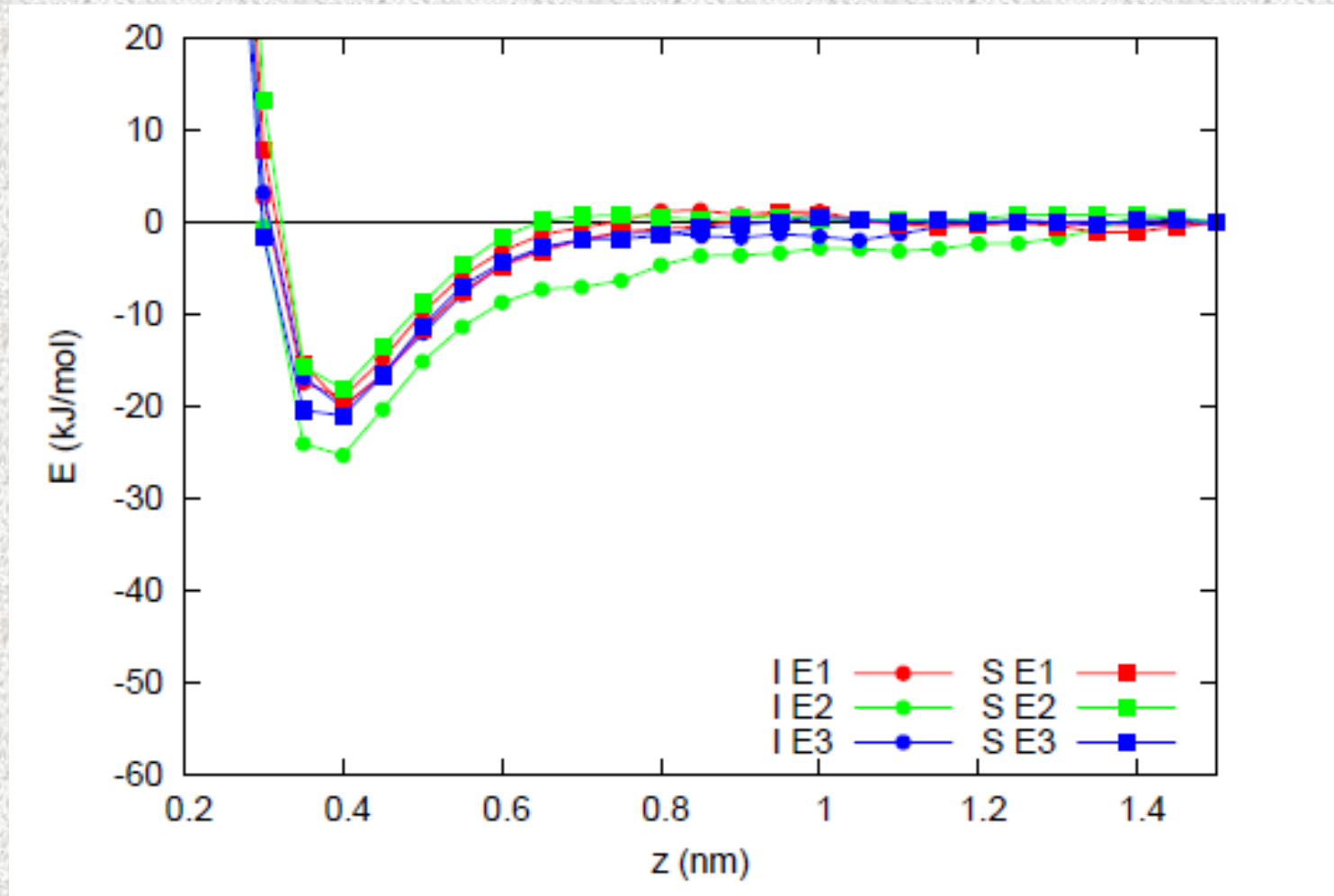
□ Effect of chain length: Interaction potential for phenyl (“P”) bead

$$U_{\text{superatom/surface}}^{\text{CG}}(\mathbf{q})$$



Polymer/Metal Interfaces: Coarse-Grained Effective Interaction

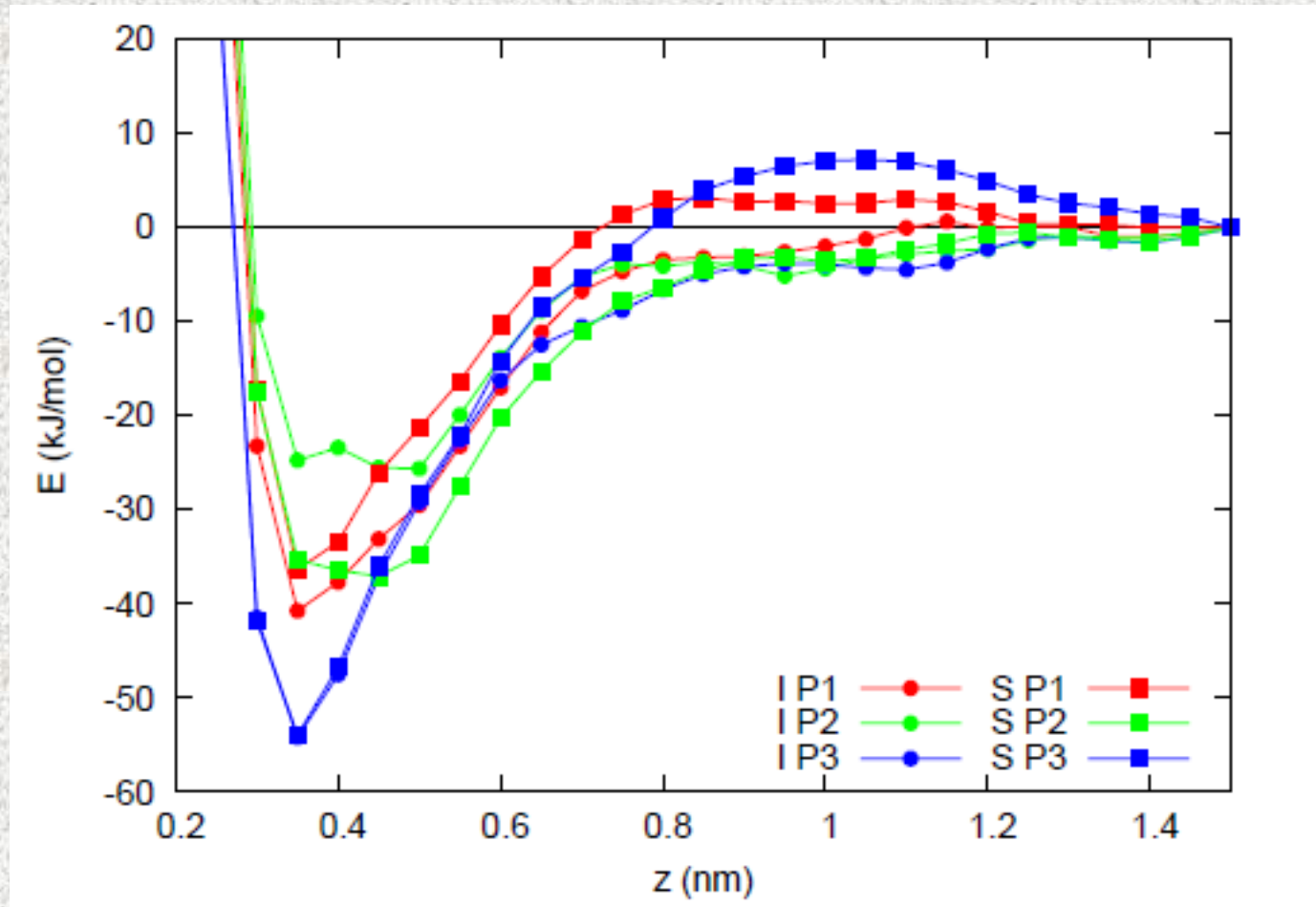
□ Effect of chain **tacticity** and **position along the chain**: Ethylene (“E”) bead



□ **Central** backbone, “E”, beads are strongly adsorbed on the surface (?)

Polymer/Metal Interfaces: Coarse-Grained Effective Interaction

□ Effect of chain **tacticity** and **position along the chain**: Phenyl (“P”) bead

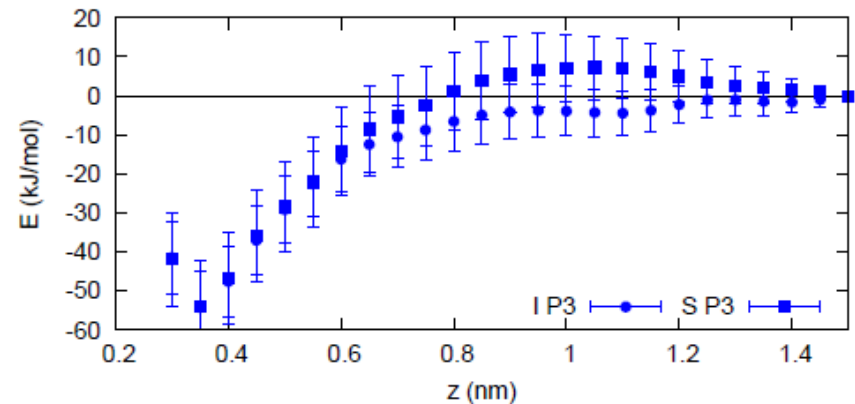
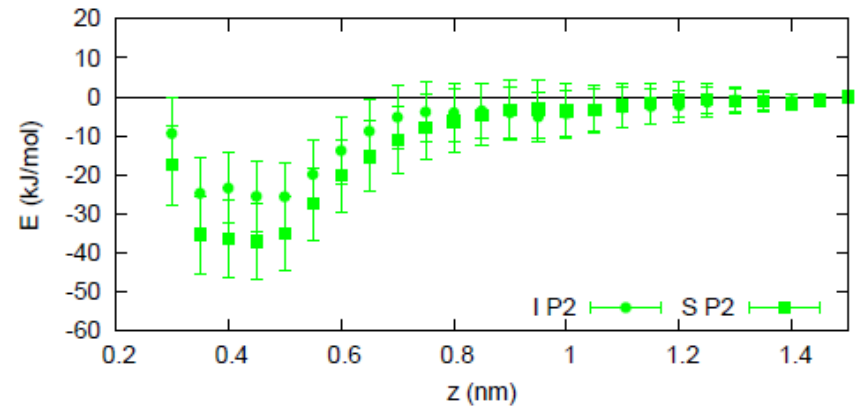
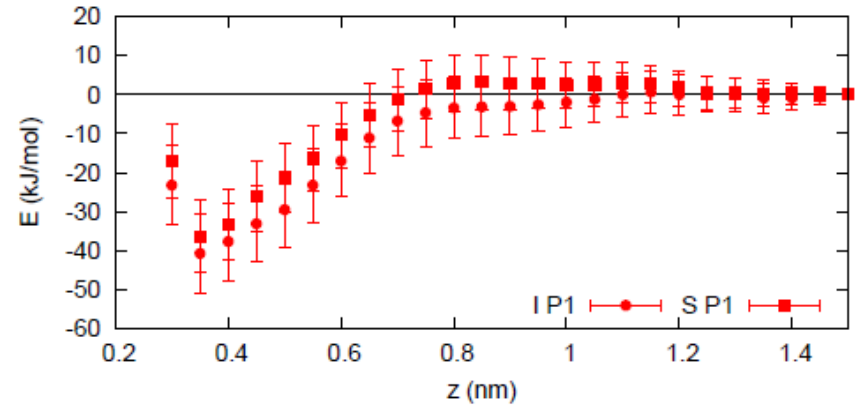


□ **End** phenyl (side) “P”, beads are strongly adsorbed on the surface (?)

Polymer/Metal Interfaces: Coarse-Grained Effective Interaction

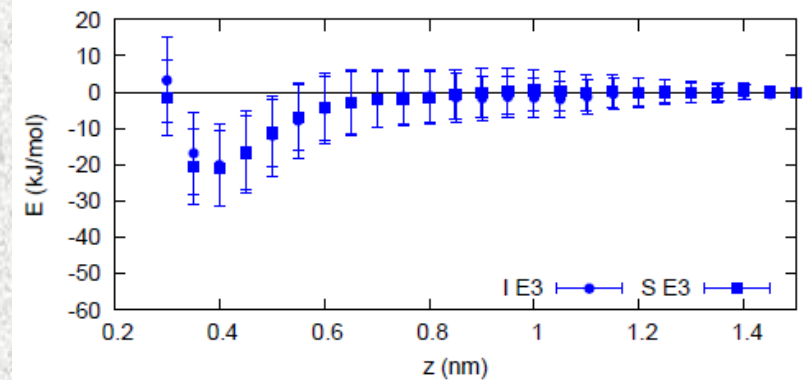
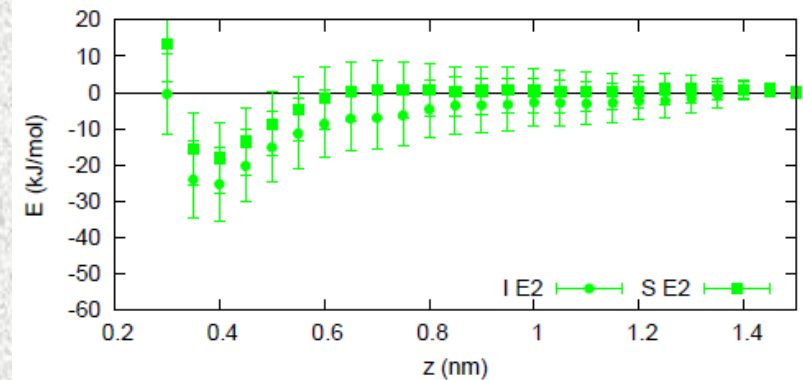
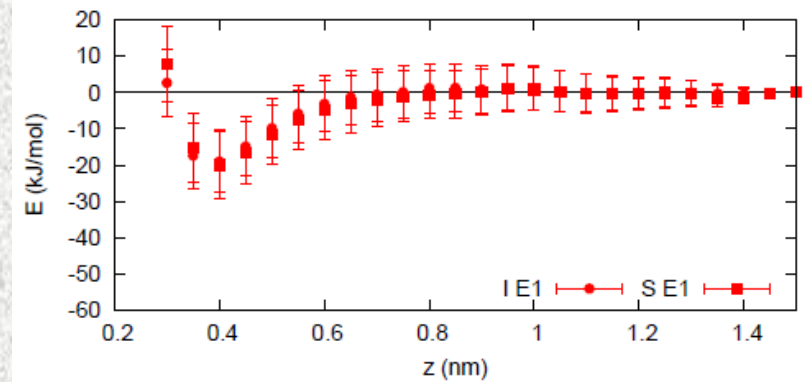
□ Effect of chain **tacticity** and **position along the chain**: Ethylene (“E”) bead

□ Central backbone, “E”, beads are strongly adsorbed on the surface (?)



Polymer/Metal Interfaces: Coarse-Grained Effective Interaction

□ Effect of chain **tacticity** and **position along the chain**: Phenyl (“P”) bead



□ Central backbone, “E”, beads are strongly adsorbed on the surface (?)

Current work: CG Simulations of PS/Au Hybrid Systems

□ Example: Equilibrium Polymer Melts

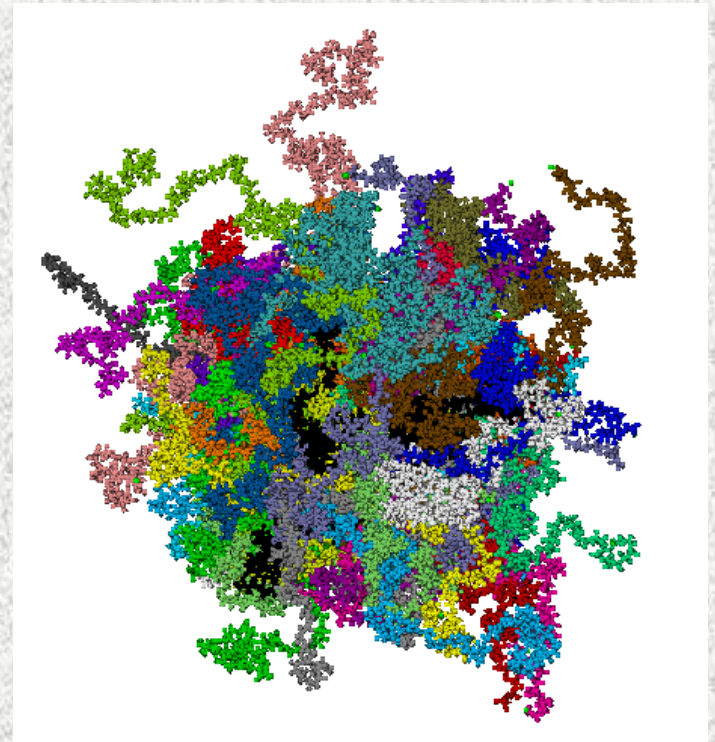
➤ Systems Studied: Atactic PS melts with molecular weight from 1kDa (10 monomers) up to 50kDa (1kDa = 1000 gr/mol).

$$m_i \frac{\partial^2 \mathbf{q}_i}{\partial t^2} = - \frac{\partial U^{CG}}{\partial \mathbf{q}_i} - \Gamma \frac{\partial \mathbf{q}_i}{\partial t} + W_i(t)$$

➤ NVT Ensemble.

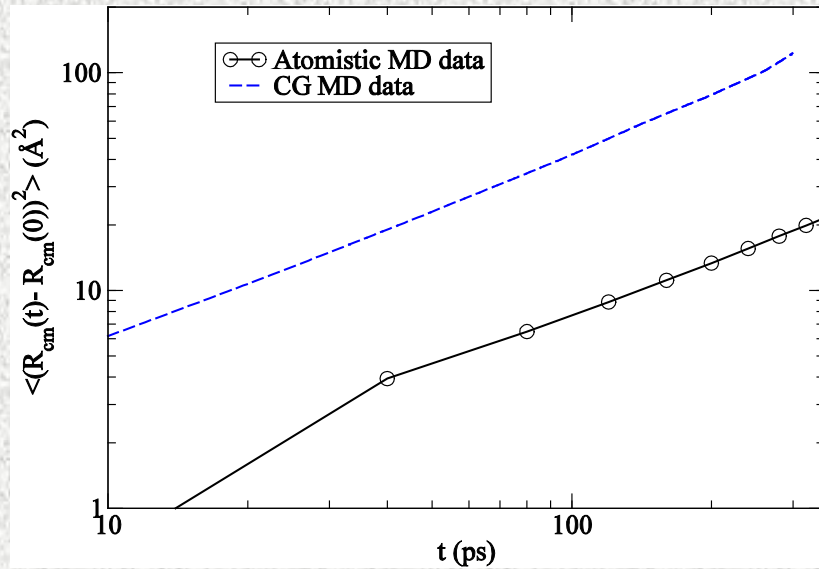
➤ Langevin thermostat (T=463K).

➤ Periodic boundary conditions.

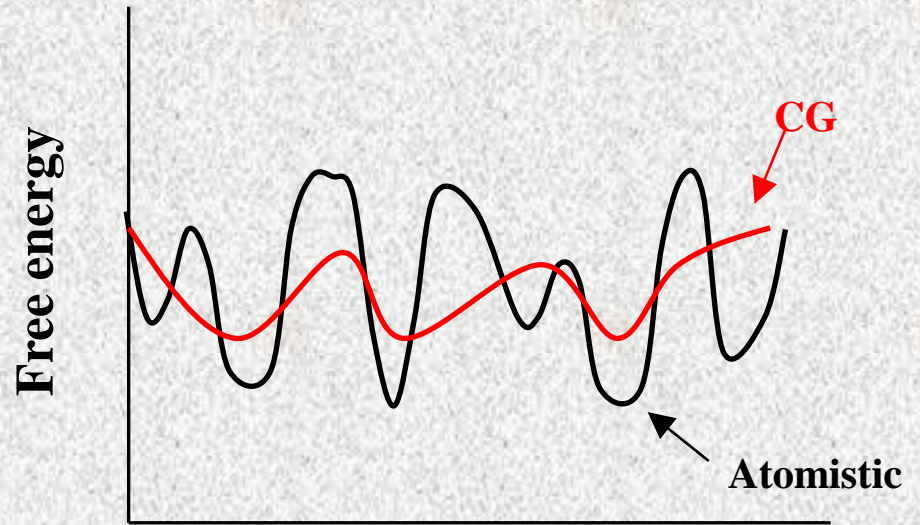


CG POLYMER DYNAMICS IS FASTER

PS, 1kDa, T=463K



Free Energy Landscape



Configuration

-- CG effective interactions are *softer* than the real-atomistic ones due to lost degrees of freedom (lost forces).



$$\zeta_{AT} > \zeta_{CG}$$

$$D_{AT} < D_{CG}$$

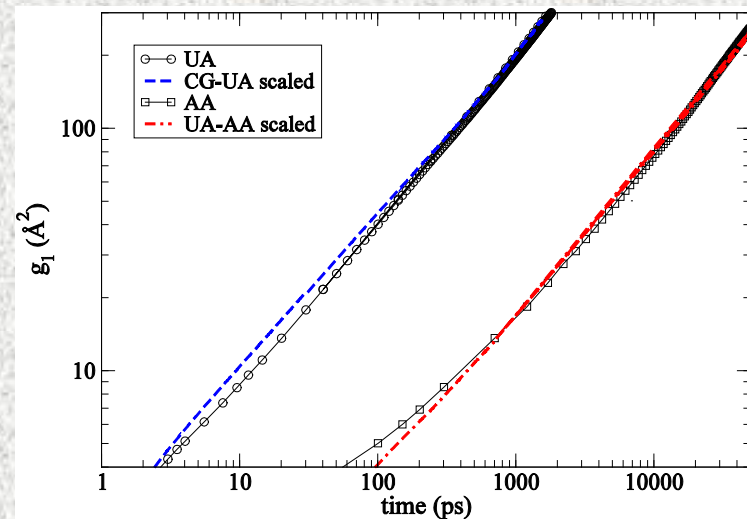
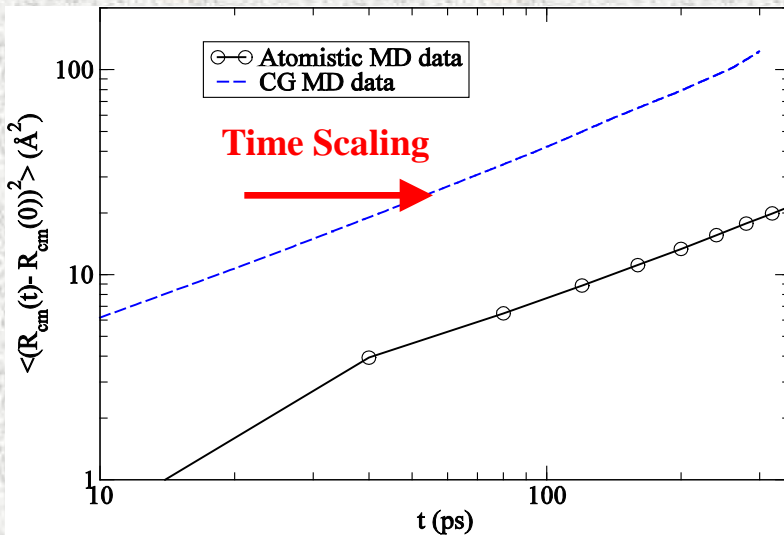
POLYMER DYNAMICS THROUGH CG SIMULATIONS

Quantitative Predictions - Proposed Semi-empirical Method:

➤ find the proper time in the CG description by **scaling the raw data in time**.

A. Perform long microscopic (atomistic) simulations in a reference system.

B. Time mapping at that specific state point: calculate S for this system! $S = \tau_x \equiv \frac{D_{CG}}{D_{AT}} = \frac{\zeta_{AT}}{\zeta_{CG}}$



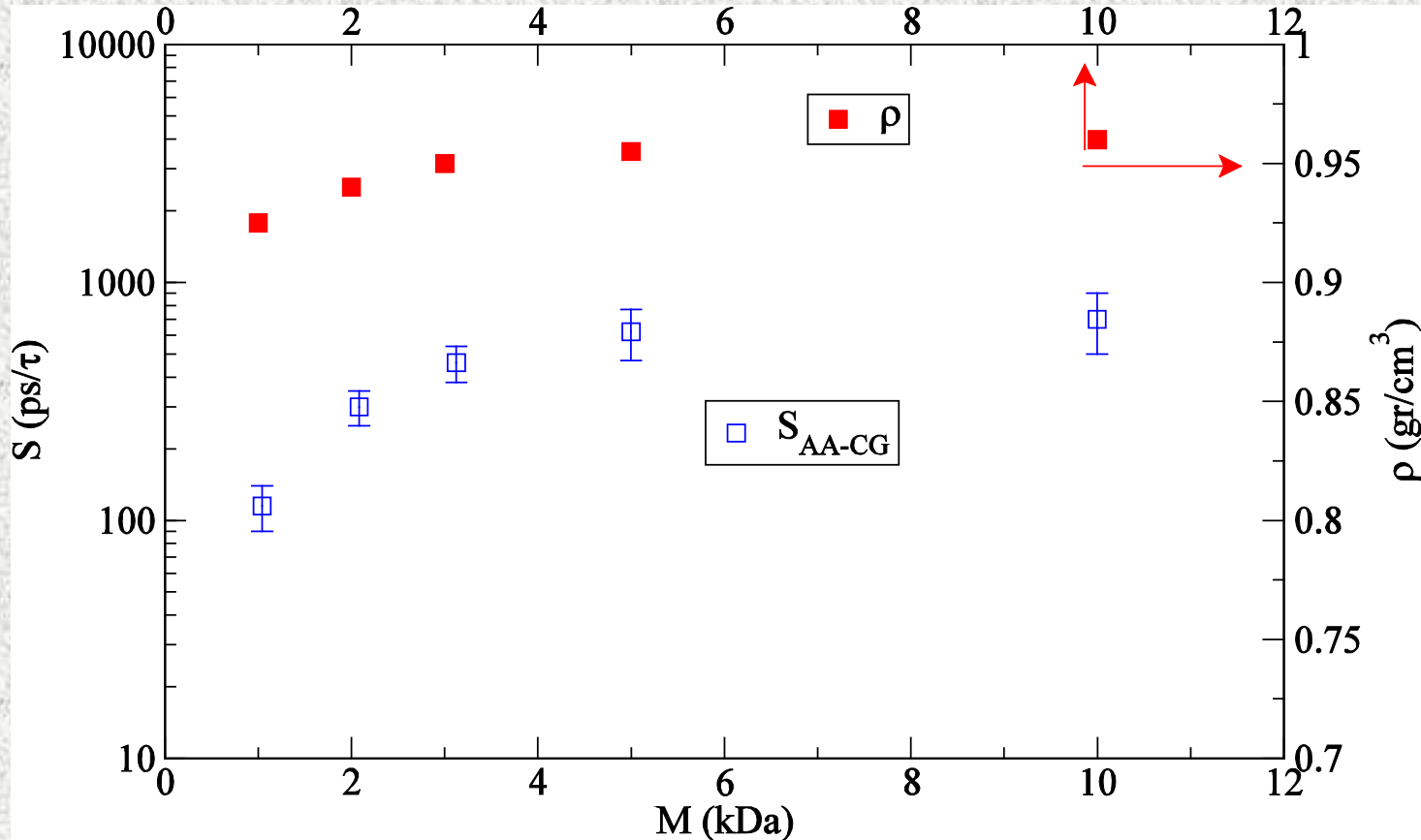
C. Check **transferability** of S for different systems, conditions (ρ , T , P , ...).



APPLICATION: DYNAMICS OF LONG POLYSTYRENE MELTS

➤ How does scaling parameter S depends on M , density?

$$S \equiv \frac{D_{CG}}{D_{AT}} = \frac{\zeta_{AT}}{\zeta_{CG}}$$

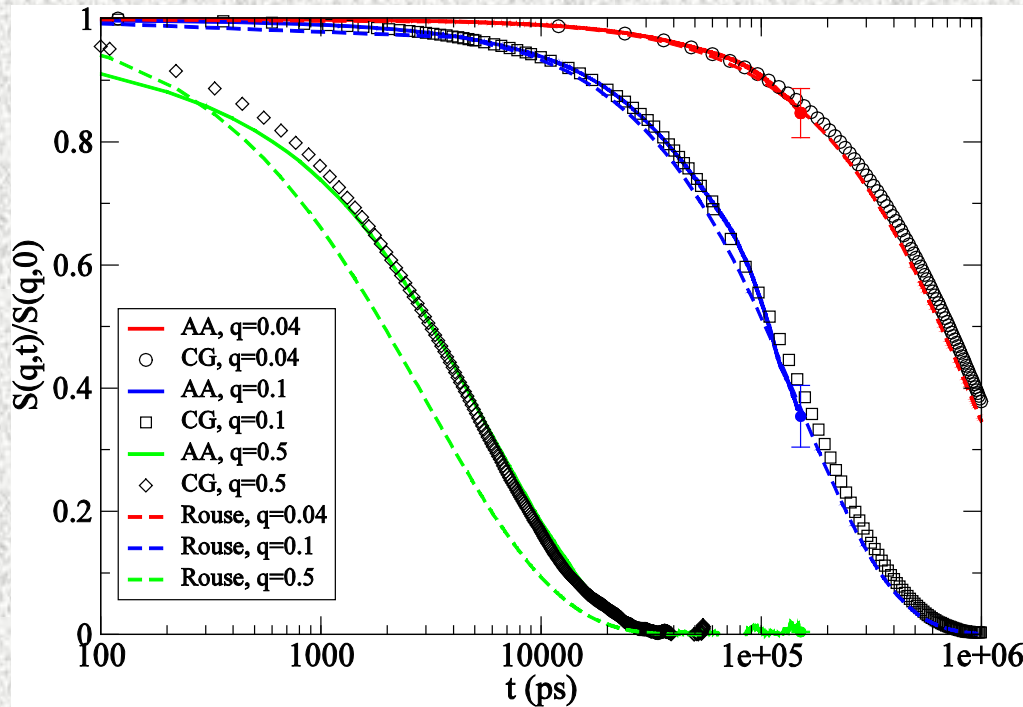


[V. Harmandaris and K. Kremer, Soft Matter, 2012]

Local Dynamics: Single Chain Dynamic Structure Factor

[Harmandaris and Kremer, *Macromolecules*, 42, 791 (2009); *Soft Matter* 2009]

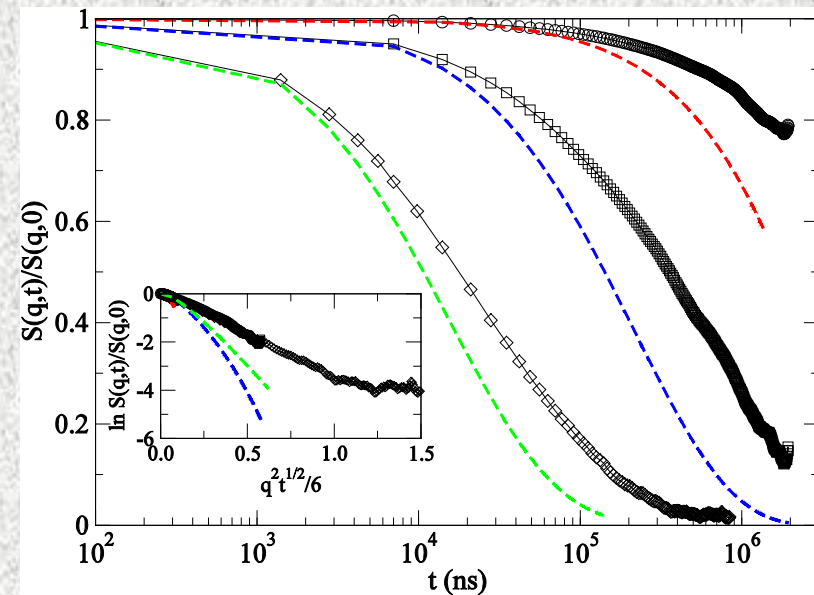
Short PS melt (M=1kDa)



$$S(q,t) = \sum_{nm} \left\langle \frac{\sin[qR_{nm}(t)]}{qR_{nm}(t)} \right\rangle$$

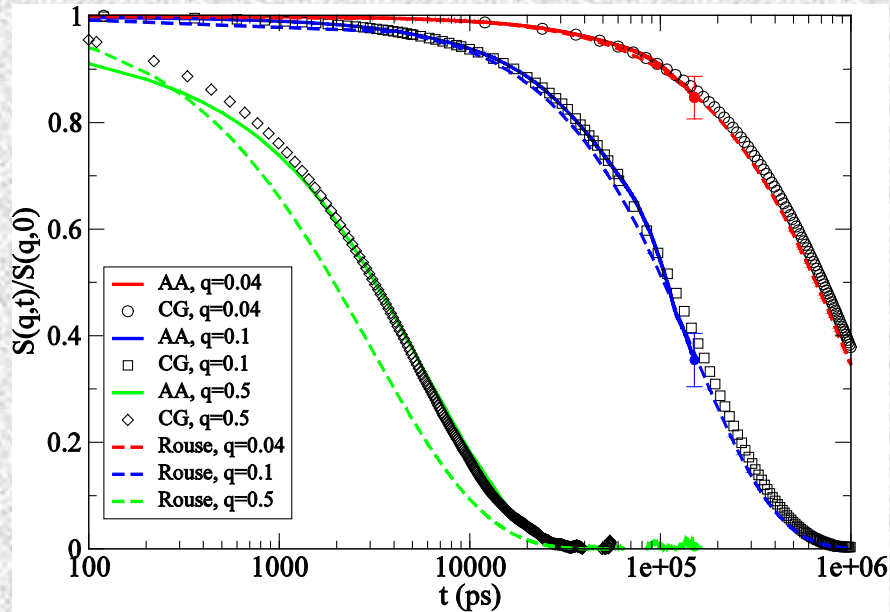
$$R_{nm}(t) \equiv r_n(t) - r_m(0)$$

Entangled PS melt (M=50kDa)



Local Dynamics: Single Chain Dynamic Structure Factor

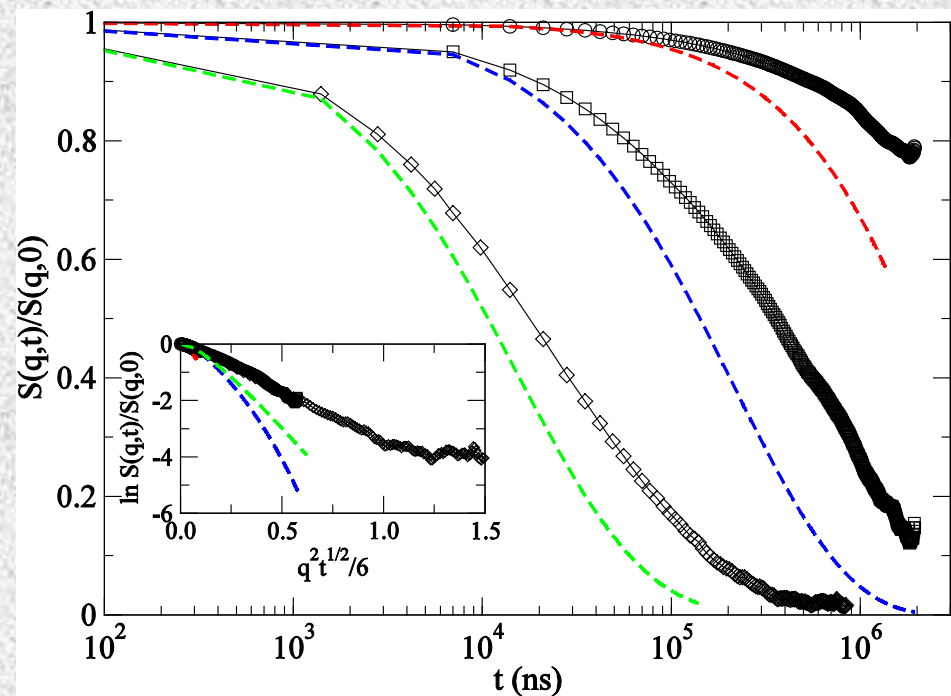
Short PS melt (M=1kDa)



$$S(q,t) = \sum_{nm} \left\langle \frac{\sin[qR_{nm}(t)]}{qR_{nm}(t)} \right\rangle$$

$$R_{nm}(t) \equiv r_n(t) - r_m(0)$$

Entangled PS melt (M=50kDa)

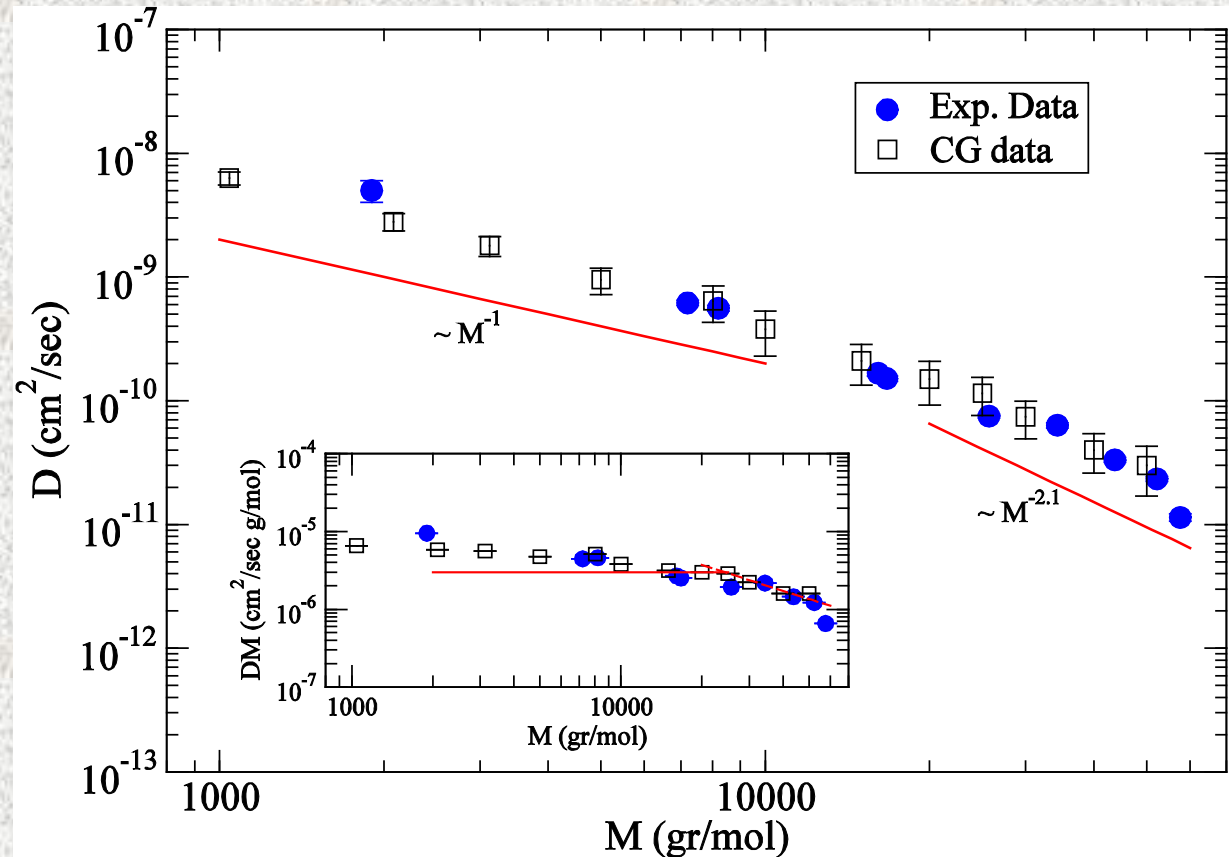


CALCULATION OF M_e : Self Diffusion Coefficient

- Crossover regime: **from Rouse to reptation dynamics**. Correct raw diffusion data for the chain end free volume effect.

-- Rouse: $D \sim M^{-1}$

-- Reptation: $D \sim M^{-2}$



Crossover region:

-- CG MD: $M_e \sim 28.000-33.000$ gr/mol

-- Exp.: $M_e \sim 30.0000-35.000$ gr/mol

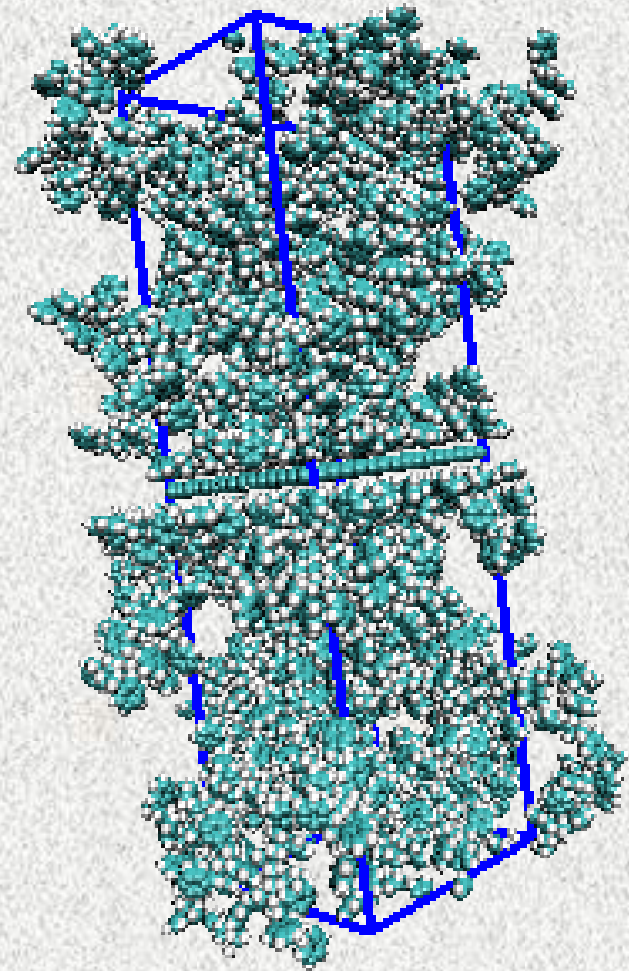
-- Exp. Data: NMR [Sillescu et al. Makromol. Chem., 188, 2317 (1987)]

Modeling of Polymer Nanocomposites: Polymer/Graphene Interfaces

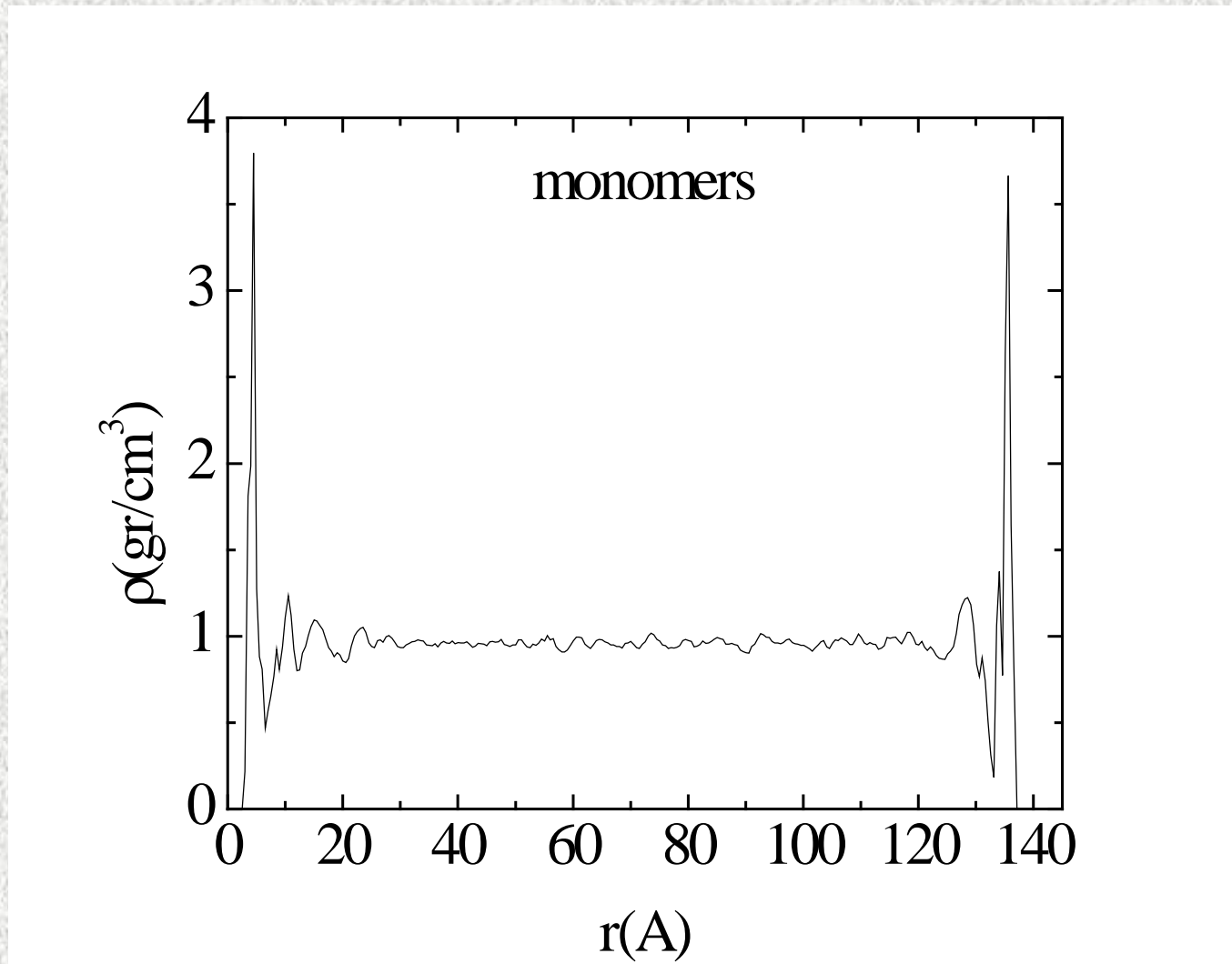
[T. Rissanou and VH, to be submitted]

Polystyrene/Graphene model systems

- Single layer solid phase.
- Polystyrene oligomers (10mer).
- Various Polymer/graphene systems.
- Film thickness: From 2 nm up to 12 nm.



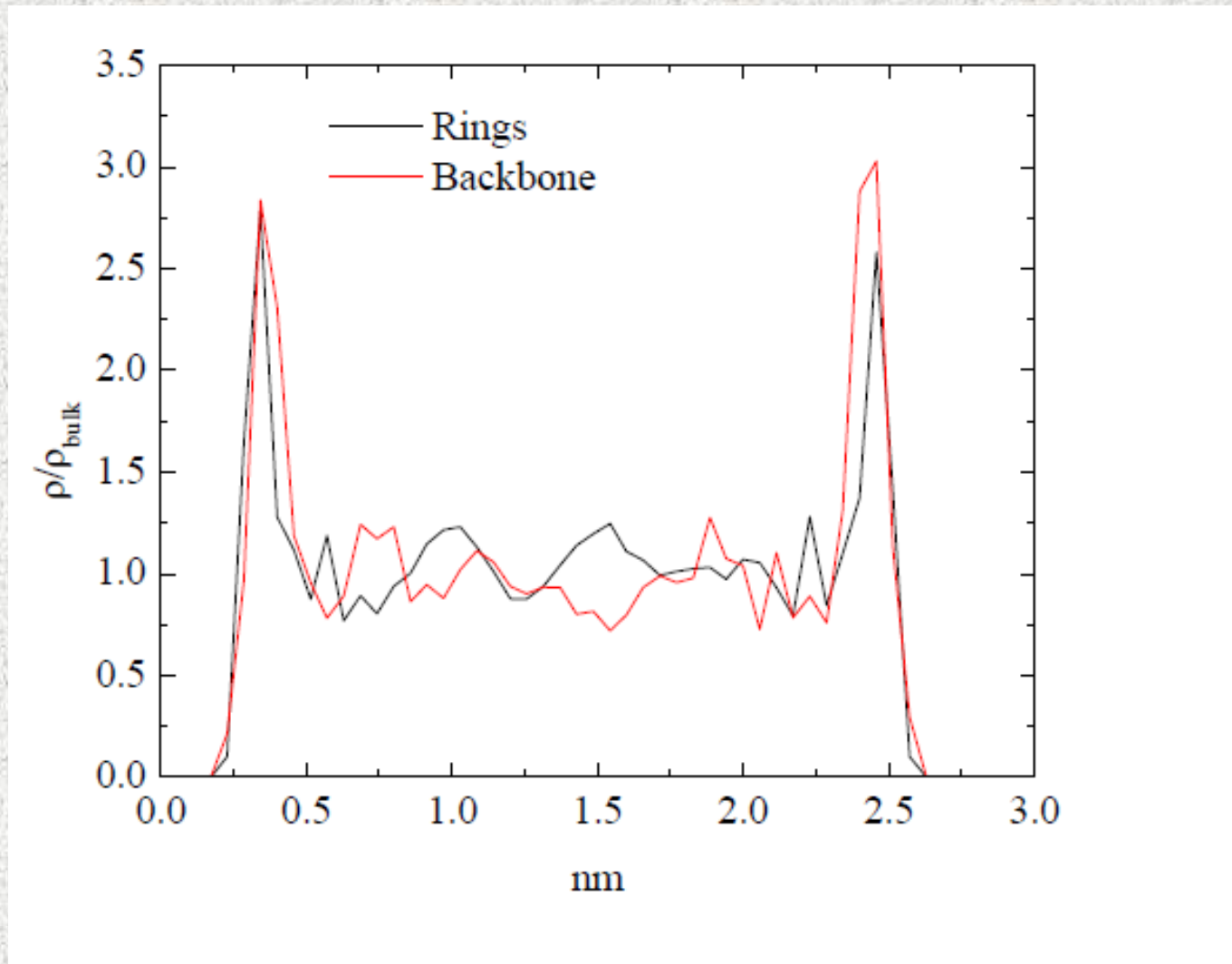
Polystyrene/Graphene Interfaces: Adhesion Strength



- Typical oscillatory profile: Density reaches plateau (bulk) value after ~ 3 nm.

Polystyrene/Graphene Interfaces: Adhesion Strength

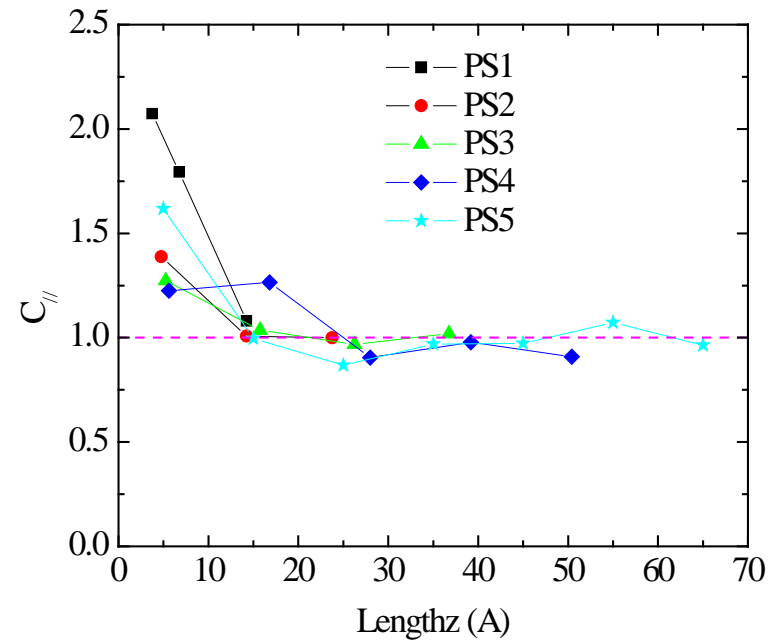
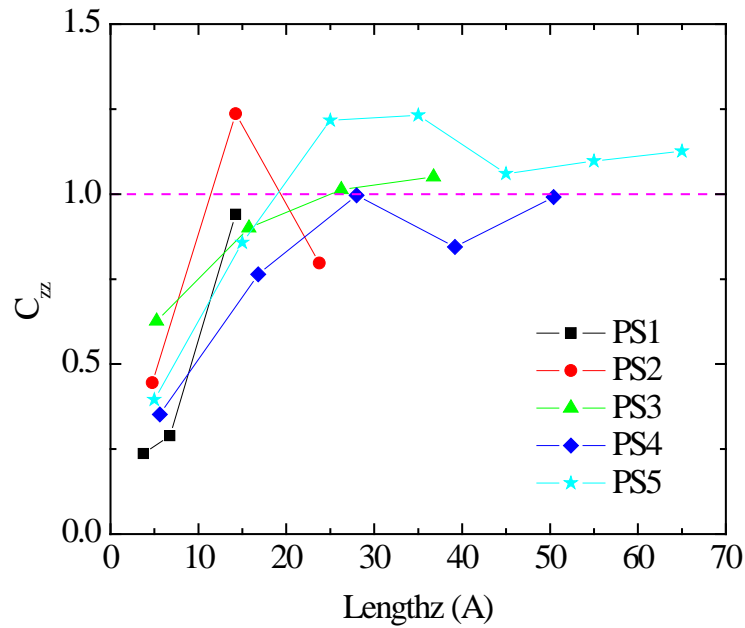
□ Density of rings, backbone in the interface:



Polystyrene/Graphene Interfaces: Structural Properties

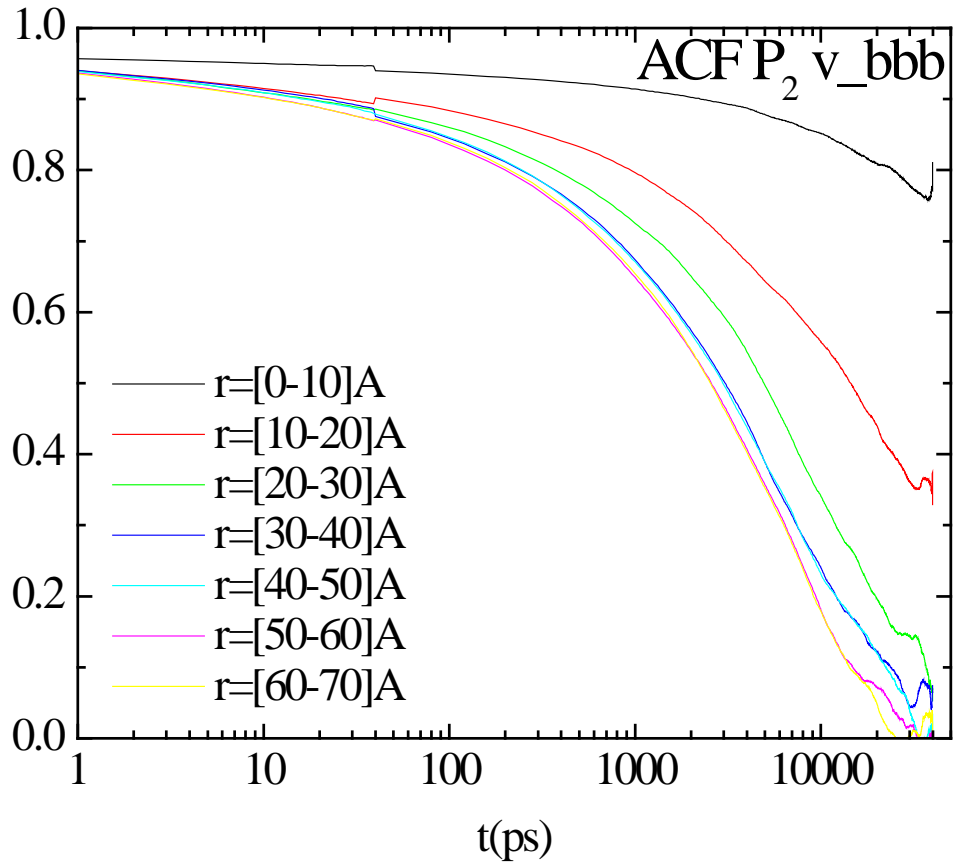
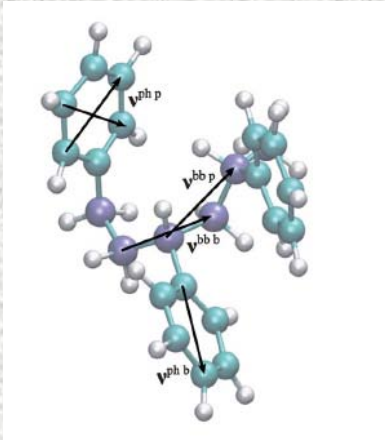
[T. Rissanou and VH, in preparation]

Conformation tensor $C_{\alpha\beta} \equiv \frac{3 \langle R_\alpha R_\beta \rangle}{\langle R^2 \rangle_{eq}}$



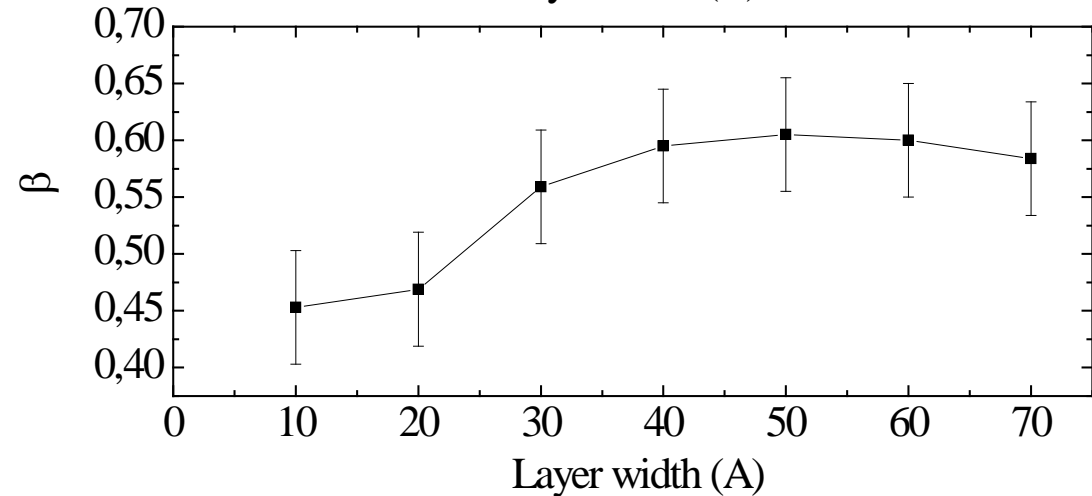
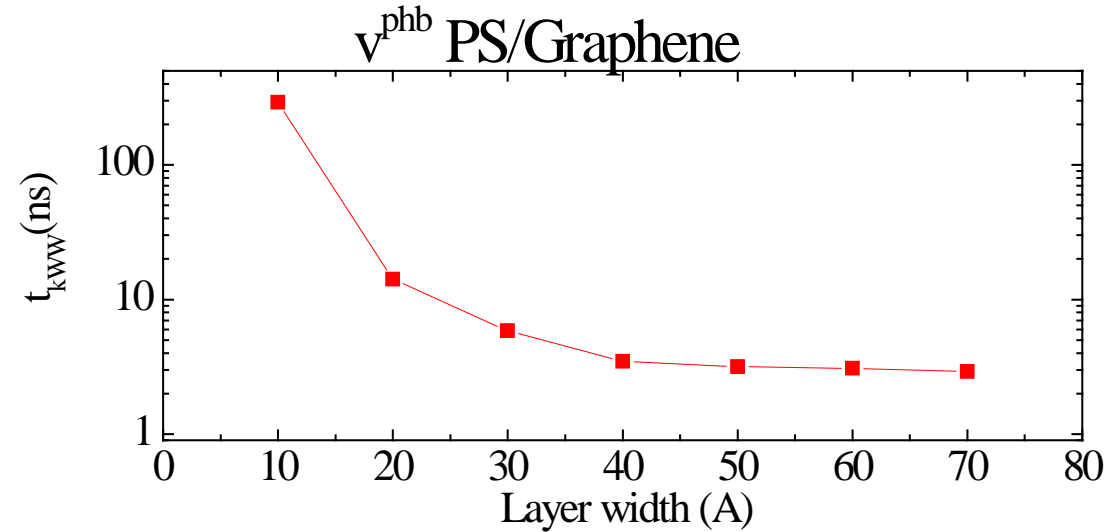
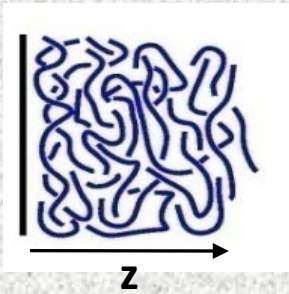
Polystyrene/Graphene Interfaces: Local Dynamics

- Local dynamics as a **function of distance** from the solid surface



Polystyrene/Graphene Interfaces: Local Dynamics

$$P_2(t) = A \exp \left\{ - \left(\frac{t}{t_{kww}} \right)^\beta \right\}$$



- ❑ **Dynamics** is much **slower** close to the interface.
- ❑ **Distribution** of relaxation times is **broader**.

CONCLUSIONS

➤ Modeling of realistic hybrid **multi-phase** nanocomposites requires **multi-scale** simulation approaches.

□ Hierarchical systematic computer simulation approach coupling:

- **quantum** (DFT),
- **microscopic** (atomistic) and
- **mesoscopic** (coarse-grained) techniques

for the study (**structure, conformation, dynamics, mechanical properties, etc.**) of polymer interfaces.

➤ **Length** scales: from $\sim 1 \text{ \AA}$ (10^{-10} m) up to 100 nm (10^{-7} m)

➤ **Time** scales: from $\sim 1 \text{ fs}$ (10^{-15} sec) up to about 1 ms (10^{-3} sec)

□ **Polymer Nanocomposites**: Size of the organic/inorganic interface depends on the properties considered.



MORE CONCLUSIONS ...

Examples:

- ✓ PS/Metal,
- ✓ PS/Graphene
- ✓ PE/Graphite,
- ✓ ... etc.

In overall: Effect of interface on polymer properties

- ✓ **density** ~ 2-3 nm,
- ✓ **conformations** ~ 2-3 R_G
- ✓ **local (segmental) dynamics** ~ 1 nm
- ✓ **global dynamics** ~ 6-7 R_G

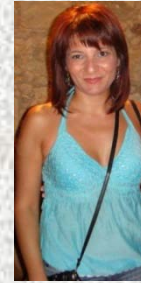
CURRENT WORK - OPEN QUESTIONS

- Polymer/solid interfaces are models of confined systems or a **single nanoparticle** embedded in a polymer matrix.
- Study of **realistic many particles polymer nanocomposites systems** requires CG modeling of huge systems.
- Model different systems. Example: PMMA/Graphene interfaces.
- DFT calculations of molecule/Graphene system.
- Effect of solid interface on glass transition temperature, T_g .
- ...

ACKNOWLEDGMENTS

Dr. T. Rissanou

[University of Crete, Greece]



Dr. K. Johnston

[Max Planck Institute for Polymers, Germany]



Funding:

DFG [SPP 1369 “Interphases and Interfaces ”, Germany]

ACMAC UOC [Greece]

Graphene Research Center, FORTH [Greece]