



materials design®

WEBINAR

Mesoscale Simulations

Jörg-Rüdiger Hill
Materials Design

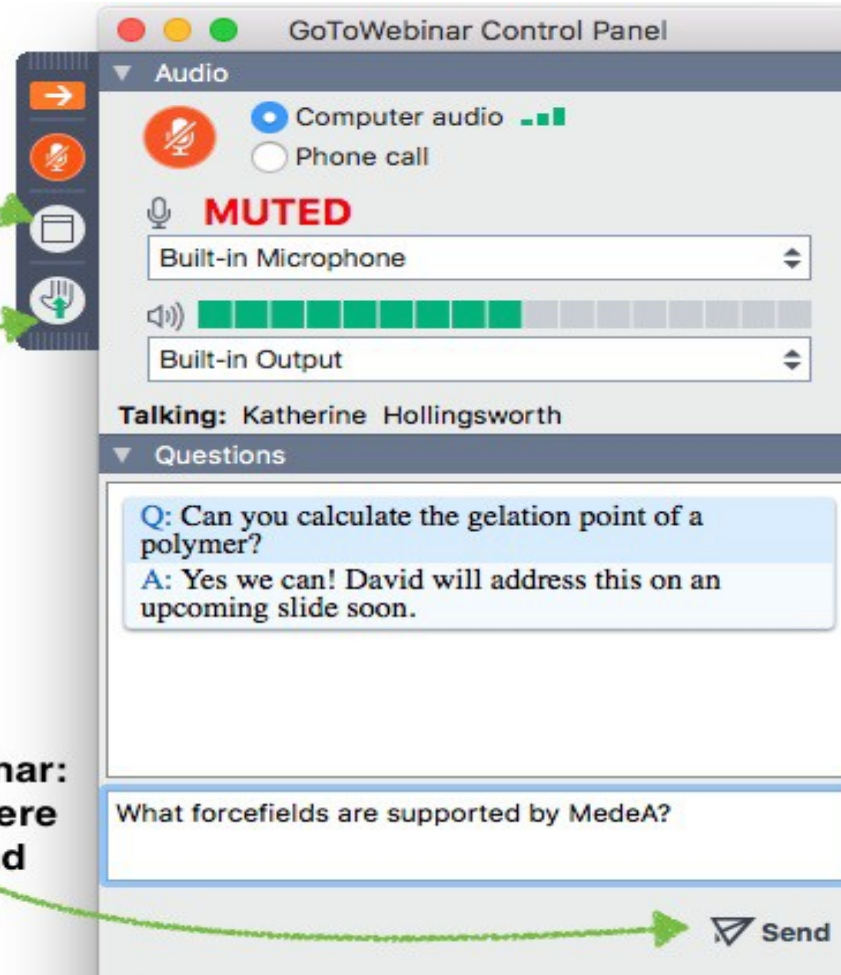
- ▶ **Share the webinar series with your colleagues!**
 - Registration details <http://www.materialsdesign.com/webinars>
- ▶ **We will be recording this webinar**
 - Watch any of our earlier webinars anytime
 - We will post upcoming webinars on the webinar page
- ▶ **Vote for the next webinar topic!**
 - Take a 2 minutes brief survey at the end of the webinar!

Please Ask Questions!

Use the raise hand icon to bring attention to your question

full screen
during discussion:


**any time during webinar:
type your question here
and then press Send**




The screenshot shows the GoToWebinar Control Panel interface. It features a sidebar on the left with icons for full screen, mute, and raise hand. The main panel is divided into sections: Audio, Talking, and Questions. The Audio section shows 'Computer audio' selected and 'MUTED' status. The Talking section shows 'Talking: Katherine Hollingsworth'. The Questions section displays a question and answer exchange, and a text input field with a 'Send' button.

GoToWebinar Control Panel



Audio

Computer audio 

Phone call

 **MUTED**

Built-in Microphone

Built-in Output


Talking: Katherine Hollingsworth

Questions

Q: Can you calculate the gelation point of a polymer?

A: Yes we can! David will address this on an upcoming slide soon.

What forcefields are supported by MedeaA?

 Send



Webinar Speakers

Katherine Hollingsworth

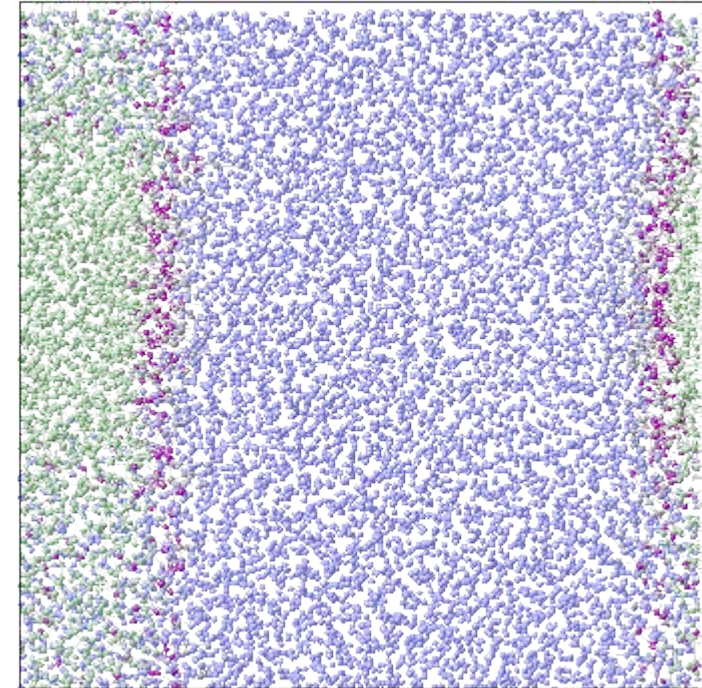
khollingsworth@materialsdesign.com

Dr. Jörg-Rüdiger Hill

jhill@materialsdesign.com

Outline

- ▶ What is mesoscale modeling?
- ▶ Theoretical background
- ▶ Mesoscale forcefields
- ▶ Application examples
- ▶ Mesoscale modeling with MedeA 3.1

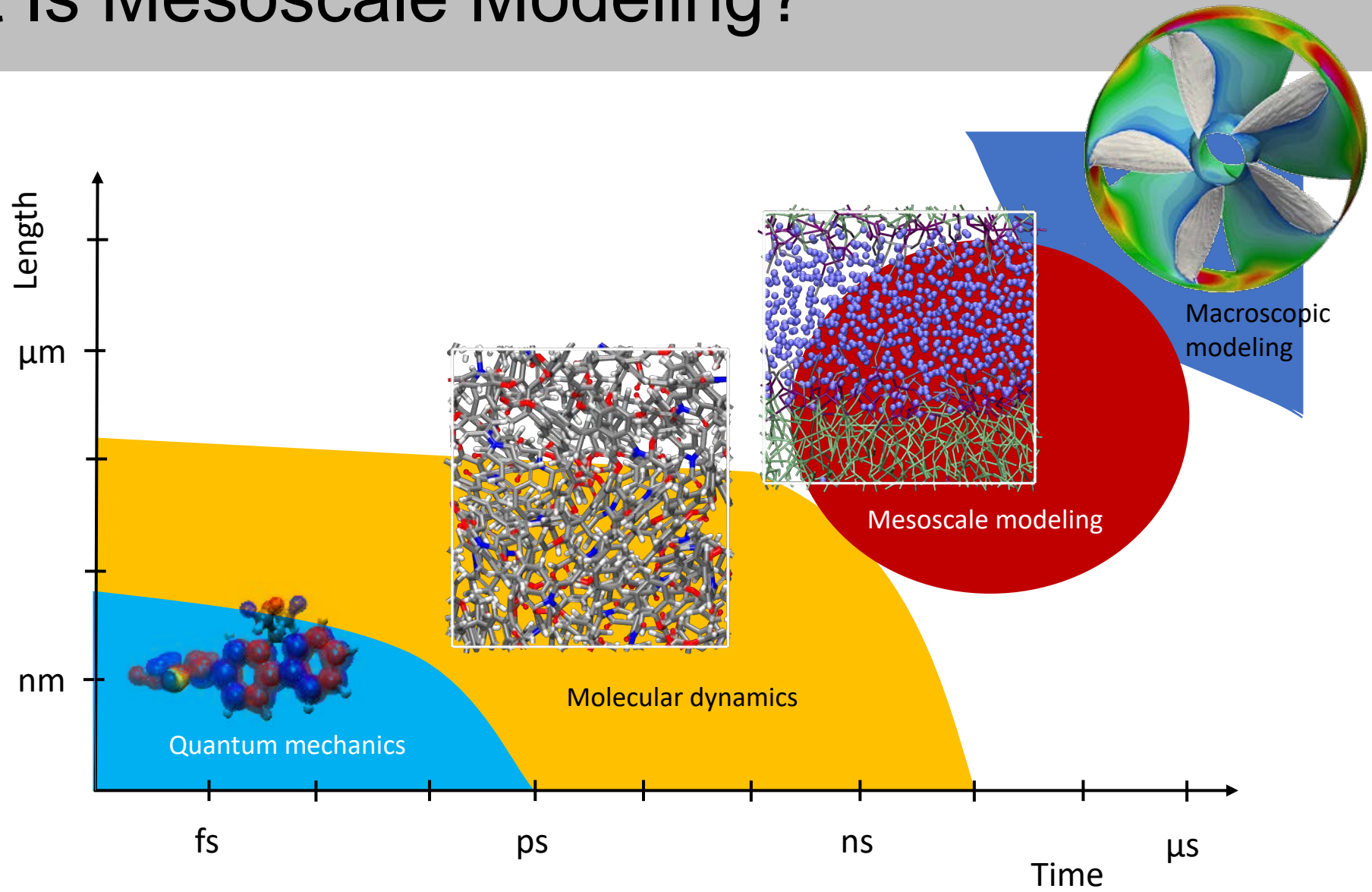




What Is Mesoscale Modeling?



What Is Mesoscale Modeling?





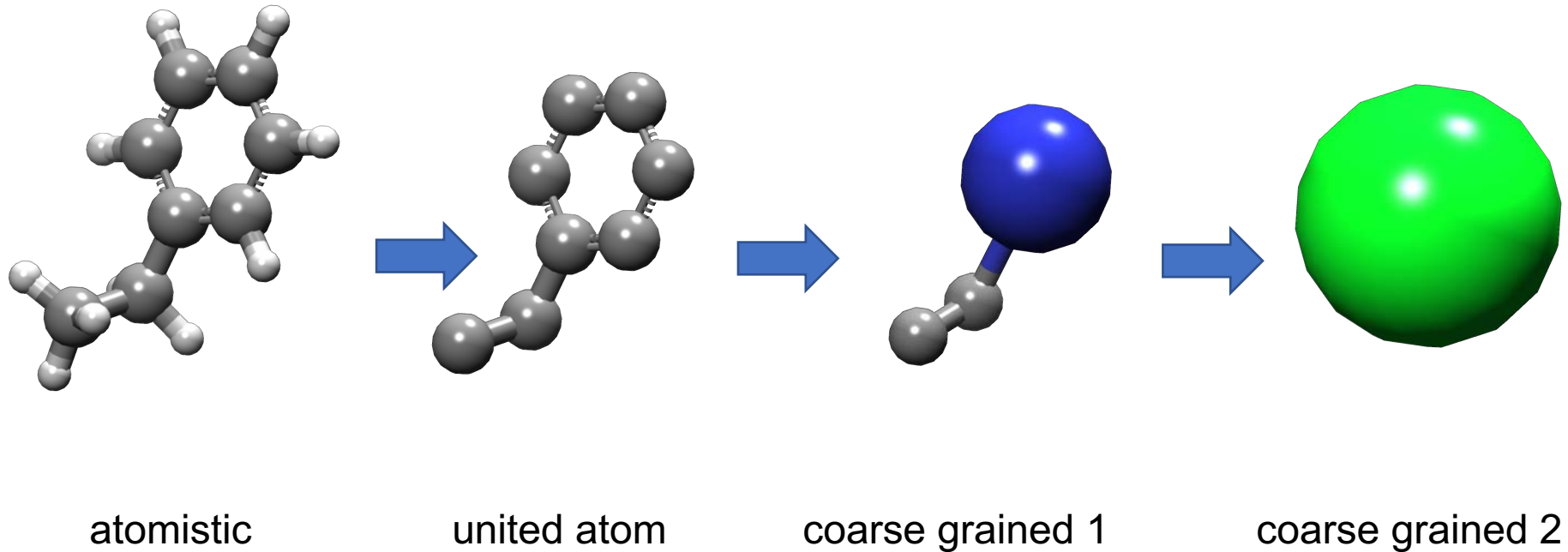
What Is Mesoscale Modeling?

- ▶ Modeling on time and length scales larger than atomistic modeling
- ▶ Groups of atoms are usually placed together in „beads“ (united atom approaches are a first step)
- ▶ One bead can also represent multiple molecules, e. g., three water molecules
- ▶ Beads can have bonds
- ▶ Forcefields are usually non-transferable
- ▶ Coarse-grained and dissipative particle dynamics (DPD) simulations



What Is Mesoscale Modeling?

Coarse graining of a styrene monomer





Theoretical Background



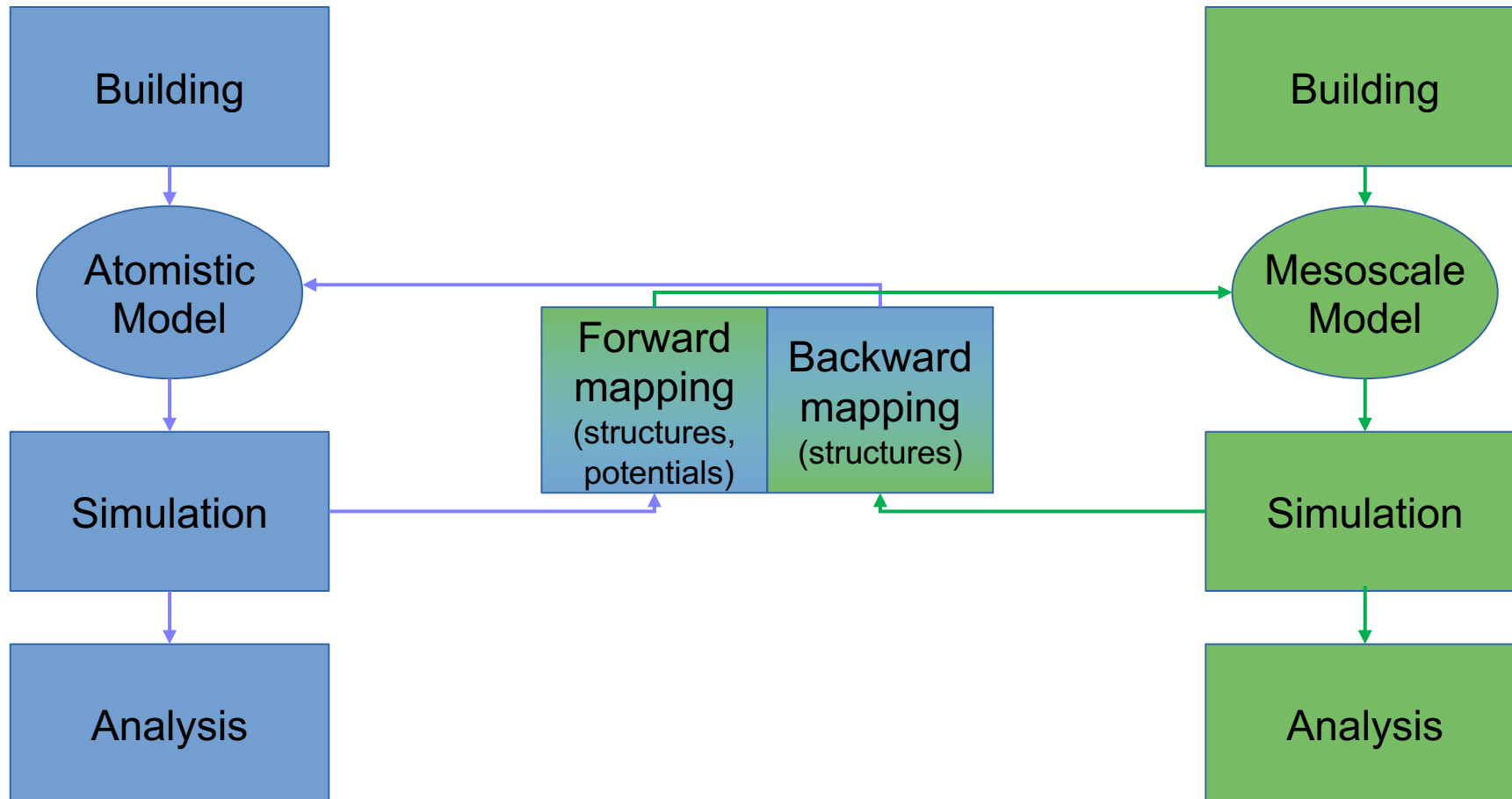
Theoretical Background

- ▶ Mesoscale models
 - Reduce number of particles
 - Smoothen potential energy surface
 - Allow longer simulation of larger systems (microseconds and tens of nanometers)
 - Lose details of system
- ▶ Building of mesoscale models
 - Direct
 - Conversion of atomistic models
- ▶ Mesoscale models can be converted to atomistic models (needs additional information)
- ▶ Forcefields
 - Designed for larger groups of molecules (Martini, SPICA)
 - System specific (fitted to atomistic data)



Theoretical Background

- Users expect smooth switching between atomistic and mesoscale simulations



Theoretical Background

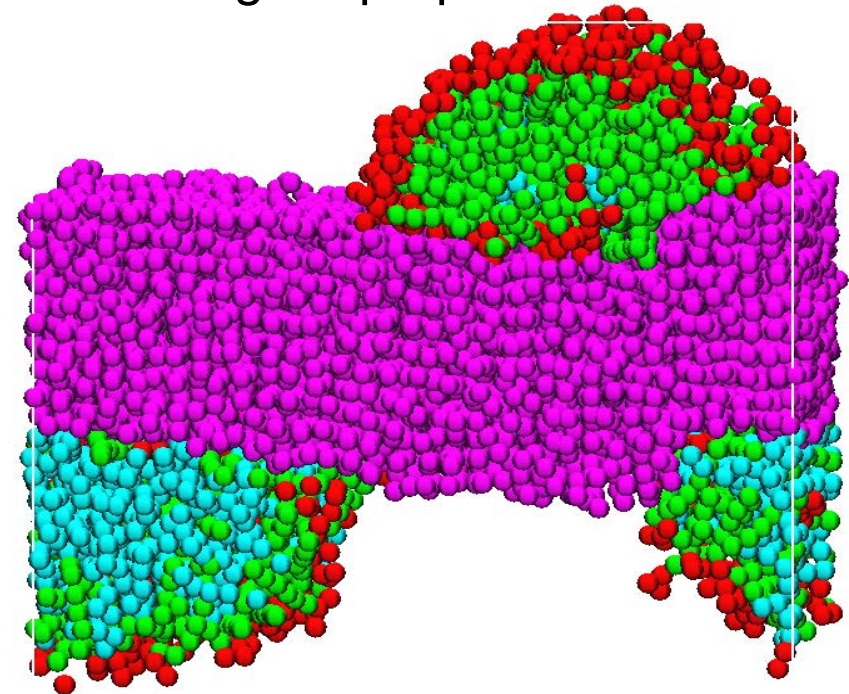
Types of mesoscale simulations

► Coarse-grained simulations

- Interaction of hard particles representing more than one atom

► DPD simulations

- Stochastic technique for simulating the dynamic and rheological properties of fluids (hydrodynamics)
- Soft interaction potential
- Fluid elements instead of particles
- Momentum is conserved locally
- Beads can be tied together with soft springs





Mesoscale Forcefields

Mesoscale Forcefields

Functional form is usually the same as for atomistic forcefields

$$E = E_{bond} + E_{angle} + E_{non-bond}$$

with

$$E_{bond} = \sum_{i=0}^n K_b (r - r_0)^2$$

$$E_{angle} = \sum_{i=0}^n K_a (\cos \theta - \cos \theta_0)^2$$

$$E_{non-bond} = \sum_{i < j} 4\epsilon_{ij} \left[\left(\frac{\sigma_{ij}}{r} \right)^{12} - \left(\frac{\sigma_{ij}}{r} \right)^6 \right] + \sum_{i < j} \frac{q_i q_j}{4\pi\epsilon_0\epsilon_r r}$$

Mesoscale Forcefields

DPD uses a different approach

$$f_i = \sum_{j \neq i} (f_{ij}^C + f_{ij}^D + f_{ij}^R)$$

with

$$\begin{aligned} f_{ij}^C &= Aw(r) \\ f_{ij}^D &= -\gamma w(r)^2 (\vec{r}_{ij} \cdot \vec{v}_{ij}) \\ f_{ij}^R &= \sigma w(r) \alpha (\Delta t)^{-1/2} \\ w(r) &= 1 - \frac{r}{r_C} \end{aligned}$$

A and γ : Forcefield parameters, $\sigma = \sqrt{2k_B T \gamma}$

α : Random number from Gaussian distribution with zero mean and unit variance

r_C : Cutoff

Mesoscale Forcefields

Common mesoscale forcefields

- ▶ [Martini](https://cgmartini.nl) (https://cgmartini.nl)
 - Developed for biomolecules (lipids etc.)
 - Extended to cover some polymers (PE, PP, PS, PEG, PSS, P3HT, PDADMA, PAMAM), ionic liquids
 - Targets structural, elastic, dynamic and thermodynamic properties
 - Usually 4 heavy atoms → 1 bead

- ▶ [SPICA](https://www.spica-ff.org) (surface property fitting coarse graining, https://www.spica-ff.org)
 - Developed for surfactants/water systems (alkanes, ethers, alcohols)
 - Targets thermodynamic properties: surface/interfacial tension and density

- ▶ Many custom made forcefields

Mesoscale Forcefields

Development of custom forcefields

- ▶ Forcefields are created by matching atomistic molecular dynamics trajectories
 - Boltzmann inversion for bonded potentials
 - Iterative Boltzmann inversion
 - Inverse Monte Carlo
 - Force matching
 - Relative entropy method
- ▶ Academic codes exist
 - Versatile Object-oriented Toolkit for Coarse-graining Applications – [VOTCA](#)
 - [MagiC](#)



Application Examples



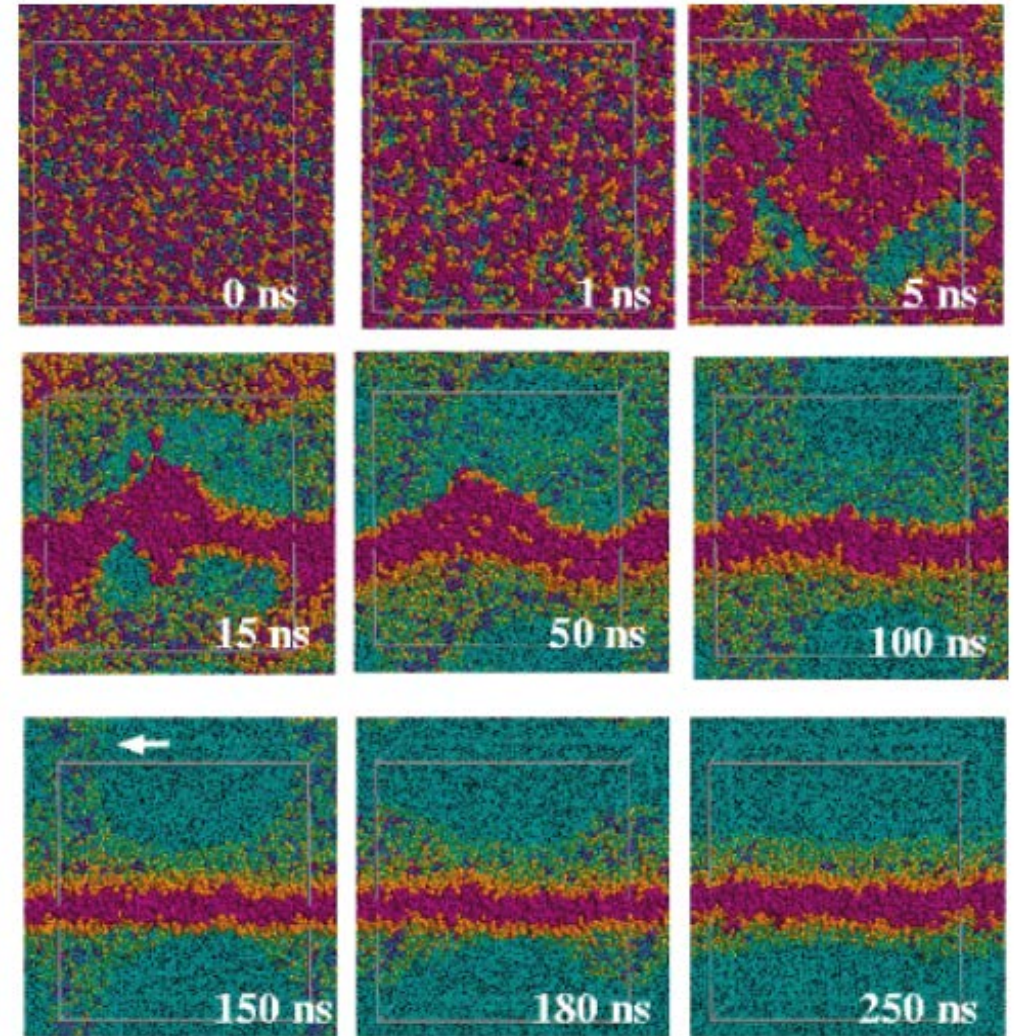
Application Examples

- ▶ Self-assembly of a lipid bilayer in water, Martini forcefield
 - S. J. Marrink, A. H. de Vries, A. E. Mark, J. Phys. Chem. B (2004), **108**, [750-760](#)
 - S. J. Marrink, H. J. Risselada, S. Yefimov, D. P. Tieleman, A. H. de Vries, J. Phys. Chem. B (2007), **111**, [7812-7824](#)
- ▶ Thermoset polyester coating, Martini forcefield
 - Rossi et al., Macromolecules (2011), **44**, [6198 - 6208](#)
- ▶ Extraction with ionic liquids, Martini forcefield
 - L. I. Vazquez-Salazar, M. Selle, A. H. de Vries, S. J. Marrink, P. C. T. Souza, [Preprint at ChemRxiv](#)
- ▶ Mechanical properties of epoxy resin, custom forcefield
 - A. V. S. S. Prasad, T. Grover, S. Basu, Int. J. Eng. Sci. Technol. (2010), **2**, [17-30](#)



Self-assembly of Lipid Bilayer

- ▶ Self-assembly of a lipid bilayer in water
- ▶ 1600 DPPC lipid and 60000 coarse-grained water molecules randomly distributed, 1 μ s simulation time
- ▶ Martini forcefield
- ▶ Bilayer is forming after around 100 ns





Thermoset Polyester Coating

- ▶ Construction of mesoscale model of thermoset used in steel coating consisting of
 - Building monomers and polymers
 - Building amorphous system
 - Cross-linking to form thermoset
- ▶ Equilibration runs of 1 μs , cross-linking for 0.1 μs

Macromolecules

ARTICLE

pubs.acs.org/Macromolecules

A MARTINI Coarse-Grained Model of a Thermoset Polyester Coating

Giulia Rossi,^{*,†} Ioannis Giannakopoulos,[†] Luca Monticelli,^{§,¶,||} Niko K. J. Rostedt,[⊥] Sakari R. Puisto,[⊥] Chris Lowe,^{||} Ambrose C. Taylor,[†] Ilpo Vattulainen,^{∇,¶} and Tapio Ala-Nissila^{†,⊙}

[†]Department of Applied Physics, Aalto University School of Science, P.O. Box 11000, FI-00076 AALTO, Helsinki, Finland

[‡]Department of Mechanical Engineering, Imperial College London, South Kensington Campus, London 6 SW7 2AZ, United Kingdom

[§]INSERM, UMR-S 665, DSIMB, 6 rue Alexandre Cabanel, 75015 Paris, France

[⊥]Mattox Ltd., Pembroke House, 36-37 Pembroke Street, Oxford OX1 1BP, United Kingdom

^{||}Becker Industrial Coatings Ltd., Goodlass Road, Speke, Liverpool L24 9HJ, United Kingdom


[∇]Department of Physics, Tampere University of Technology, P.O. Box 692, FI-33101, Tampere, Finland

[¶]MEMPHYS, Center of Biomembrane Physics, University of Southern Denmark, Campusvej 55, DK-5230 Odense M, Denmark

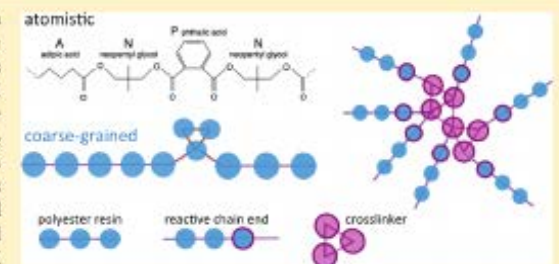
[⊙]Department of Physics, Brown University, P.O. Box 1843, Providence, Rhode Island 02912-1843, United States

^{*}Université Paris Diderot – Paris 7, UFR Sciences du Vivant, Paris, France

[†]INTS, Paris, France

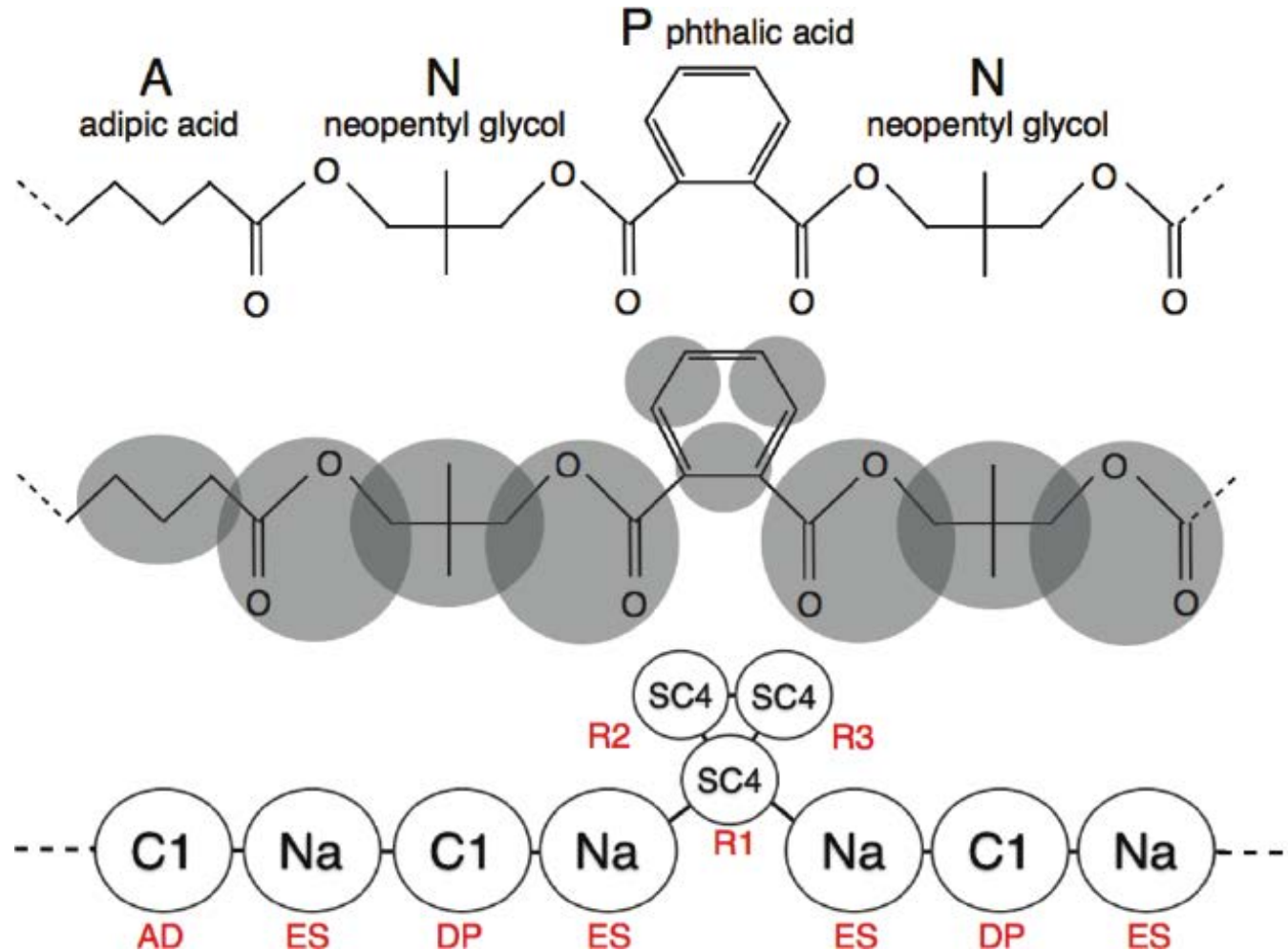
 Supporting Information

ABSTRACT: We hereby present a coarse-grained model of a typical polyester resin for coil coating applications. We validate the model via comparison with experimental data. The interactions between coarse-grained particles are described by the MARTINI force-field [Marrink et al. et al. J. Phys. Chem. B 2007, 11, 7812]. Our model and molecular dynamics simulation protocols include the description of a hardener and the formation of cross-links between the hardener and the polyester resin. We perform experimental tests on the thermodynamic and mechanical properties of the system, and compare them with molecular dynamics simulations. The model estimates the glass transition temperature of the coating within 30 K of the experimental measurement. The model captures correctly the broadening effect of cross-linking on the glass transition, and on the temperature dependence of the elastic response of the polyester resin.



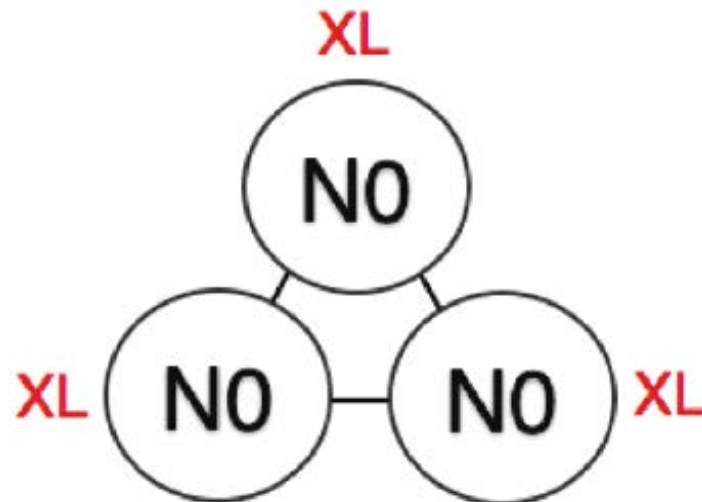
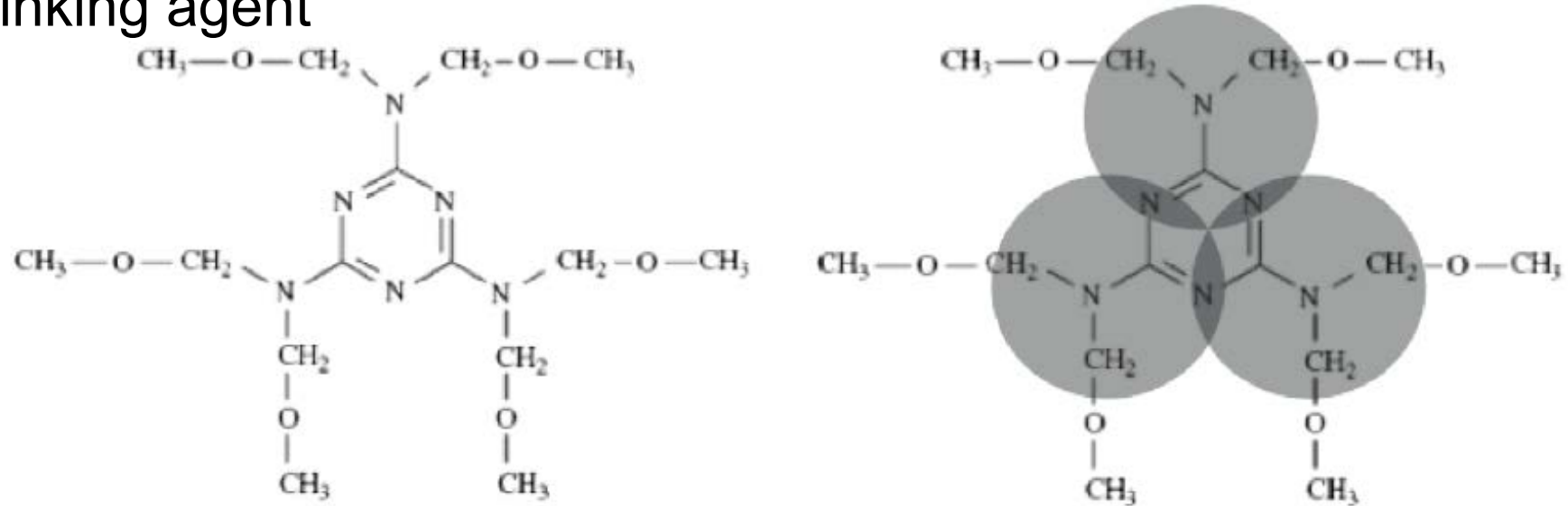
Thermoset Polyester Coating

► Polymer



Thermoset Polyester Coating

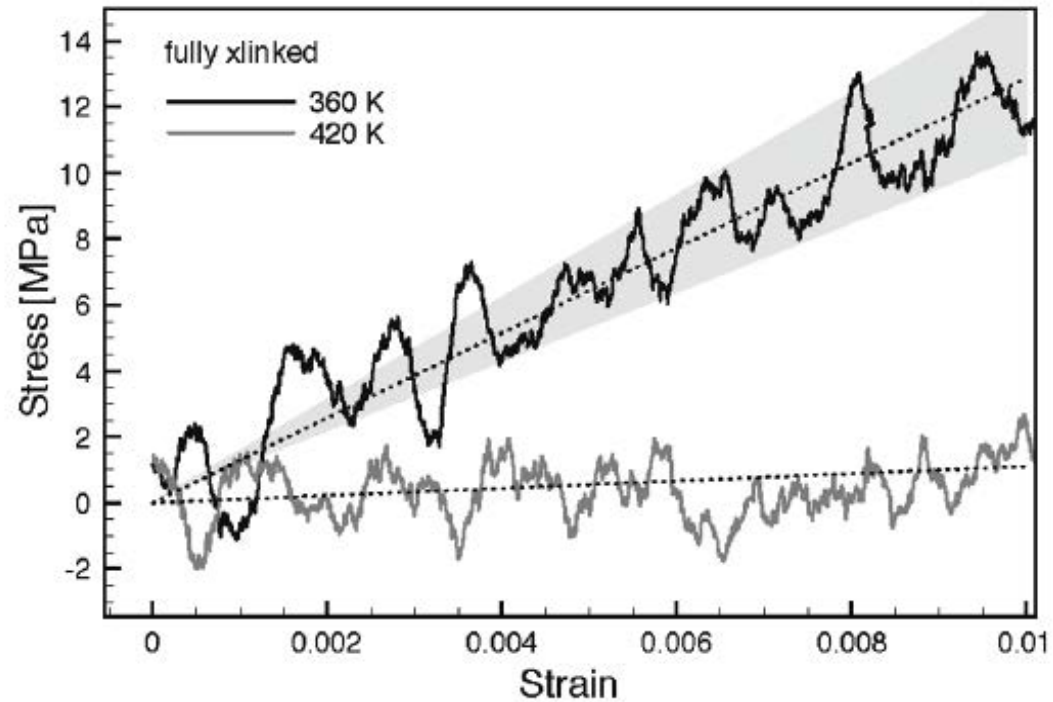
► Cross-linking agent





Thermoset Polyester Coating

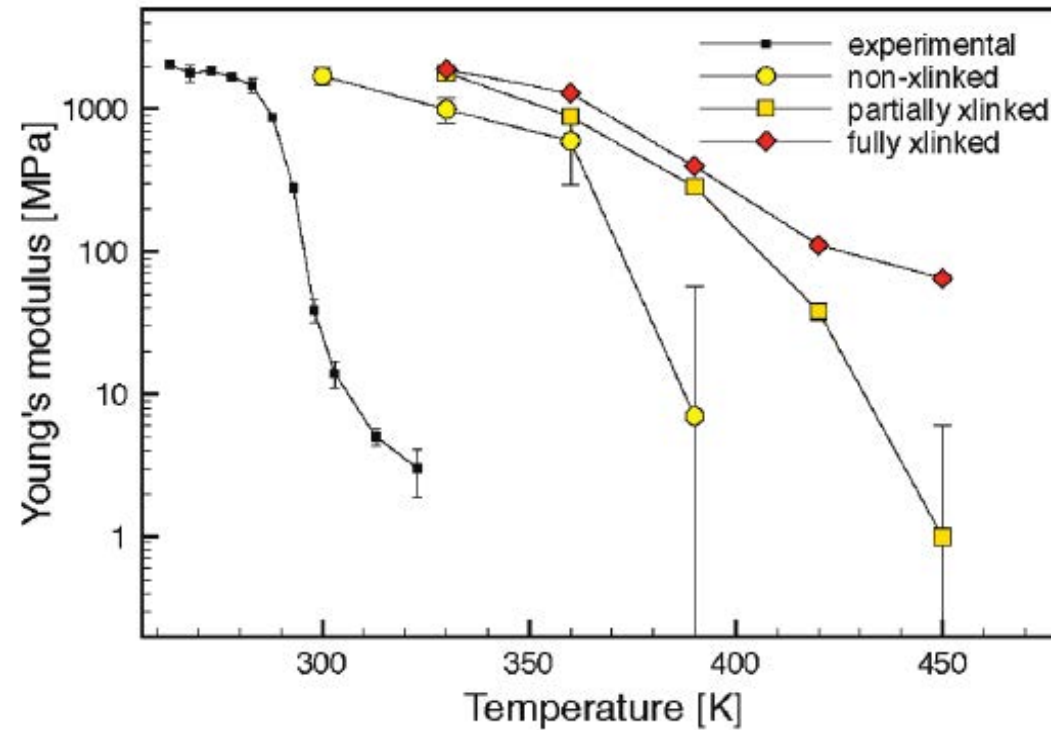
- Stress-strain curves for fully cross-linked system at different temperatures





Thermoset Polyester Coating

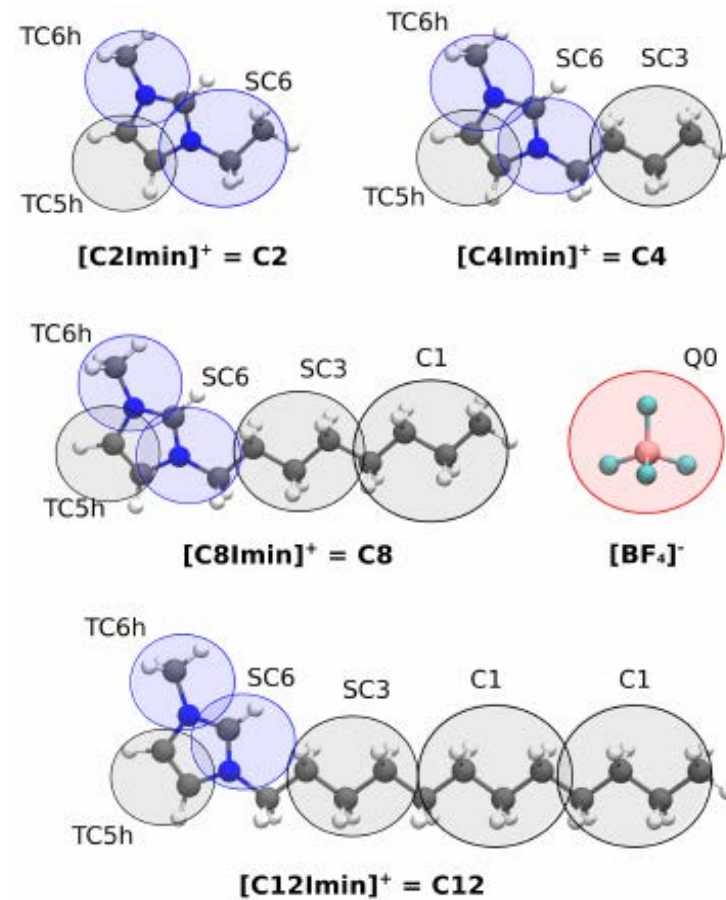
- ▶ Young's modulus as function of temperature





Extraction With Ionic Liquids

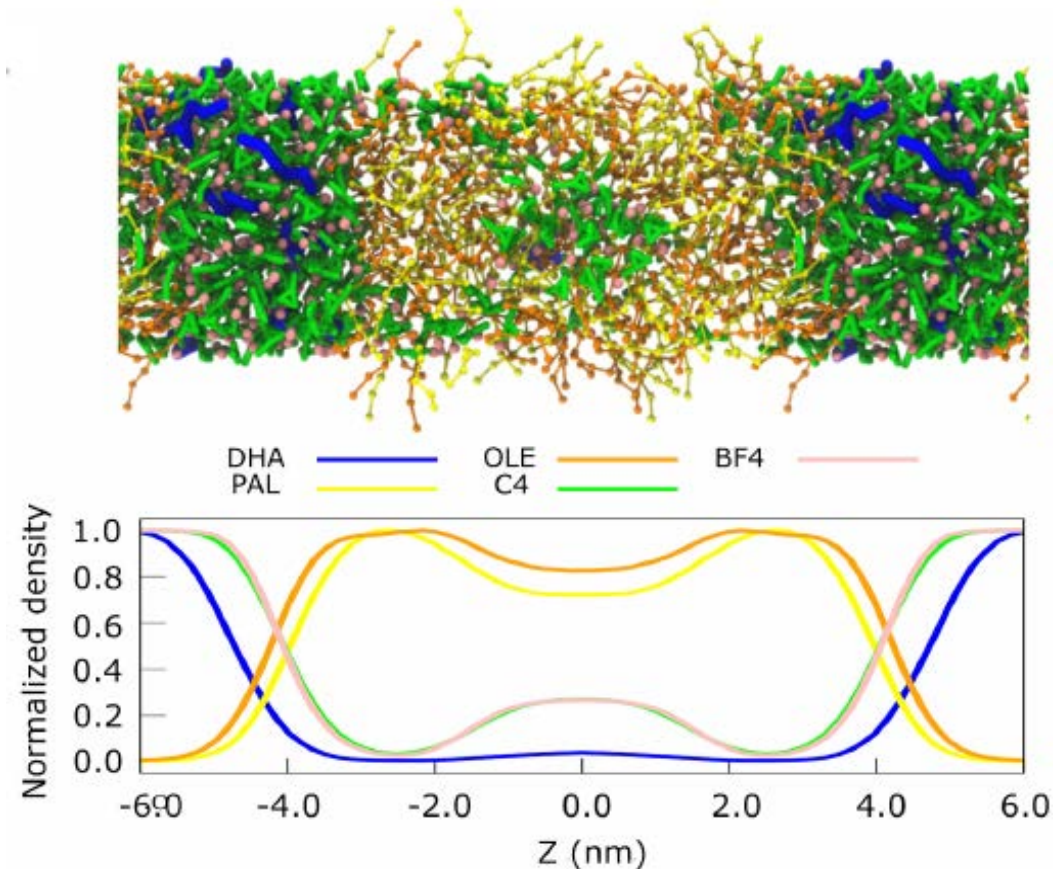
- ▶ Ionic liquids can be used to extract compounds from mixtures
- ▶ Martini forcefield was used to simulate extraction of omega-3 polyunsaturated fatty acid from mixture with saturated fatty acids (fish oil: oleic and palmitic acid and docosahexaenoic acid)
- ▶ Partial charge model for ions
- ▶ 5 x 5 x 13 nm, 4.4 μ s runs





Extraction With Ionic Liquids

- ▶ Clear separation of unsaturated fatty acid (DHA) and saturated fatty acids (OLE, PAL) at end of simulation





Extraction With Ionic Liquids

- ▶ Selectivity can be calculated from Gibbs energies

IL	ΔG^{DHA} (kJ/mol) <i>-octane / +octane</i>	ΔG^{OLE} (kJ/mol) <i>-octane / +octane</i>	ΔG^{PAL} (kJ/mol) <i>-octane / +octane</i>	Selectivity <i>-octane/+octane</i>
C2	$-10.5 \pm 0.3 / -11.8 \pm 0.2$	$24.2 \pm 2.1 / 27.4 \pm 0.3$	$27.8 \pm 0.3 / 35.2 \pm 0.2$	$765 \cdot 10^3 / 6011 \cdot 10^3$
C4	$-8.8 \pm 1.0^* / -16.8 \pm 2.8$	$12.9 \pm 0.3^* / 16.0 \pm 3.4$	$17.2 \pm 0.1^* / 20.4 \pm 1.7$	$5 \cdot 10^3 / 418 \cdot 10^3$

* Free sampling obtained by convention MD simulation was used to estimate the ΔG^{trans} in the case of C4 without octane. For all the other systems, ΔG^{trans} was obtained by US simulations.

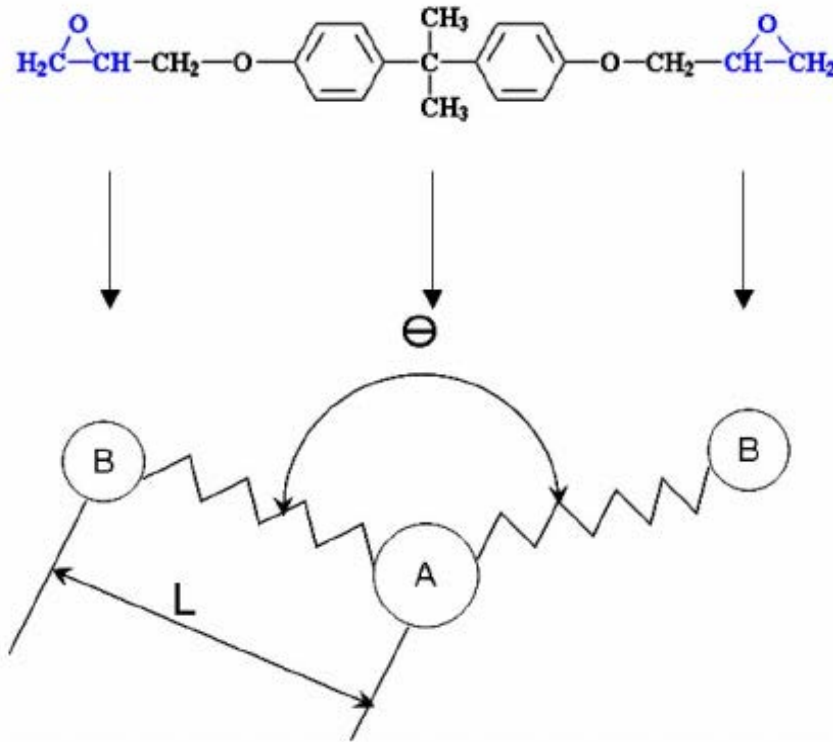
- ▶ π interactions between unsaturated bonds and imidazolium rings can explain this behaviour
- ▶ Effect of co-solvent can be shown



Virtual design of ionic liquids

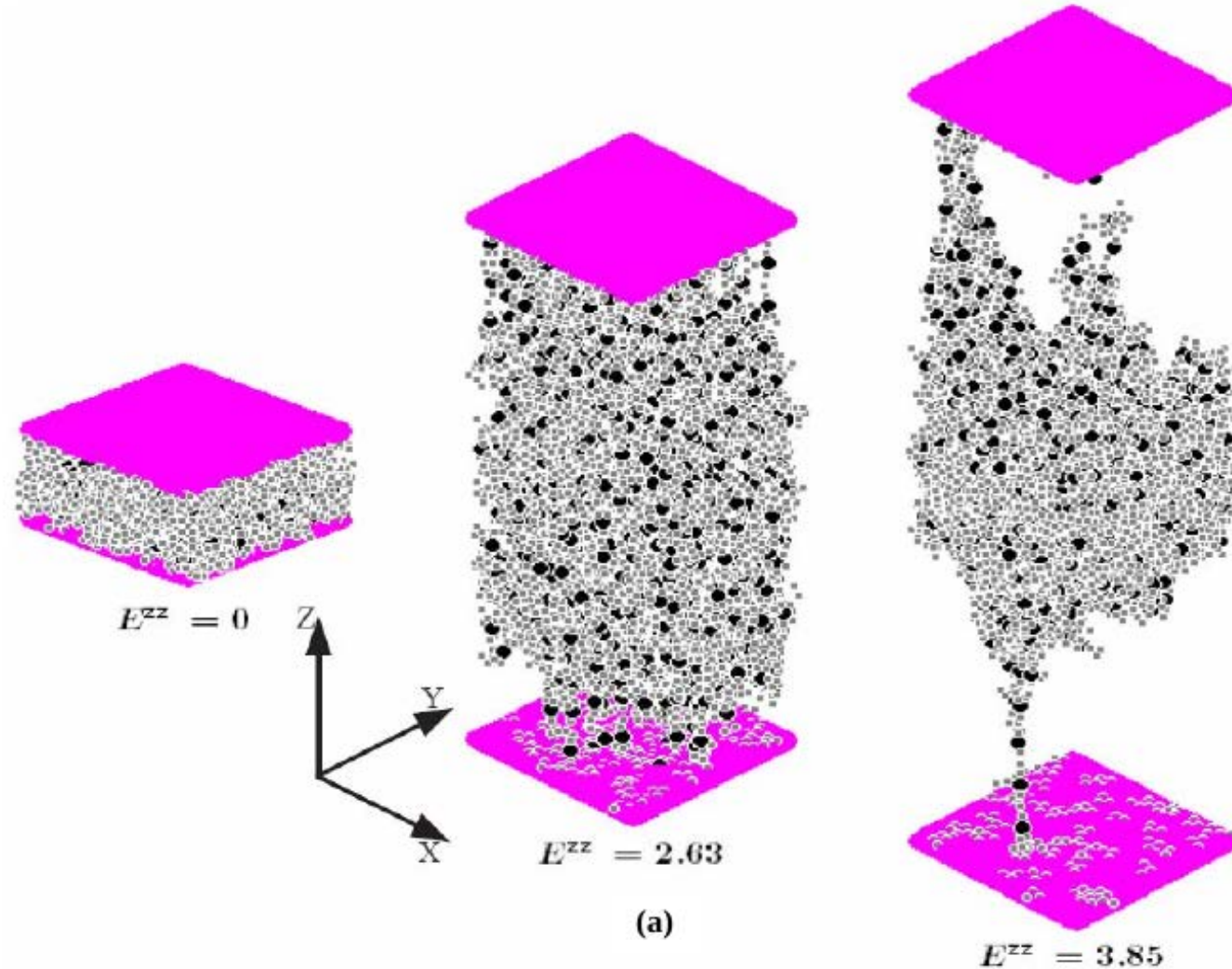
Mechanical Properties of Epoxy Resin

- ▶ Mechanical properties of cross-linked diglycidyl ether of bisphenol (A) (DGEBA) as adhesive between two rigid walls



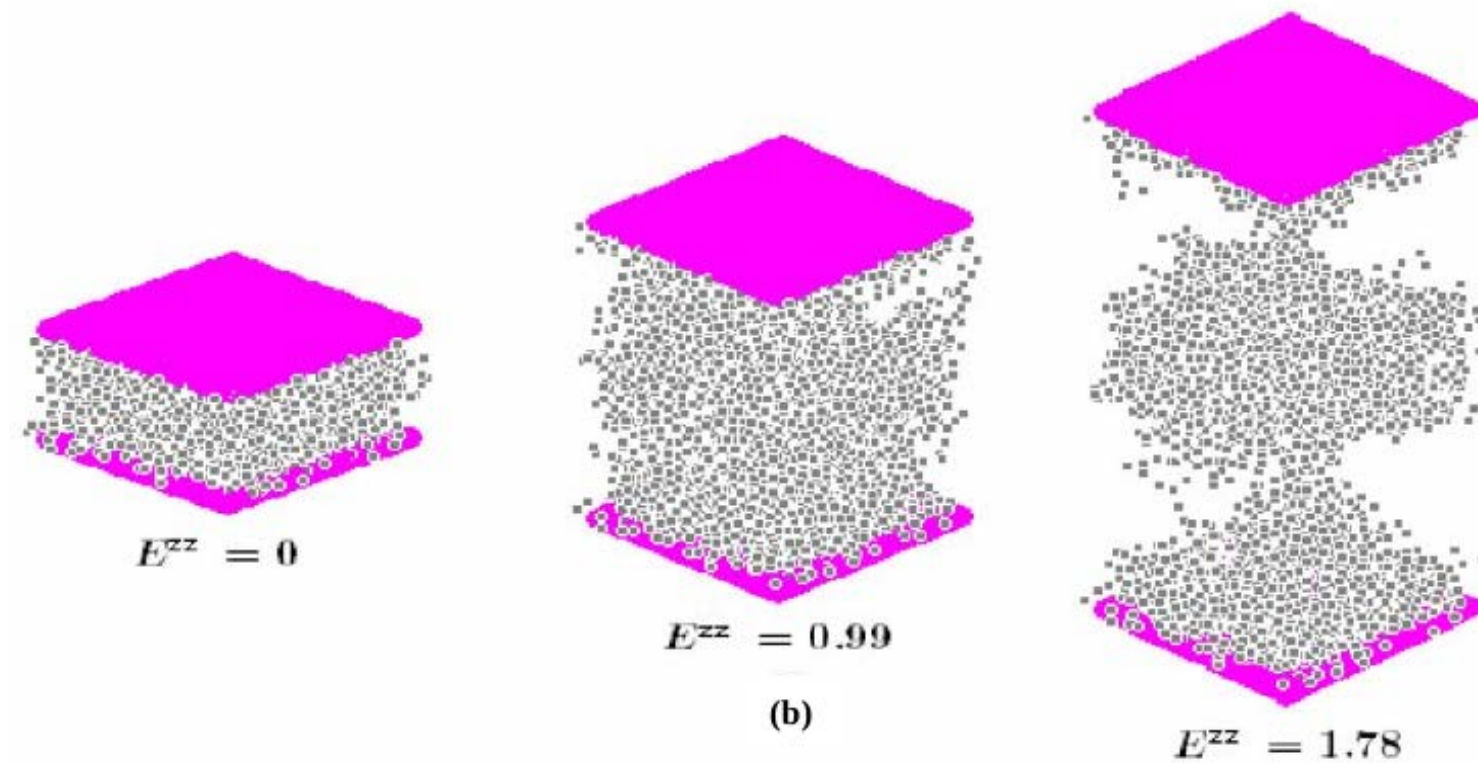
- ▶ DGEBA was modeled with three beads
- ▶ Cross-linker is represented by one bead which can form four bonds
- ▶ System is placed between two walls which are pulled apart

Mechanical Properties of Epoxy Resin



Fully cross-linked system

Mechanical Properties of Epoxy Resin

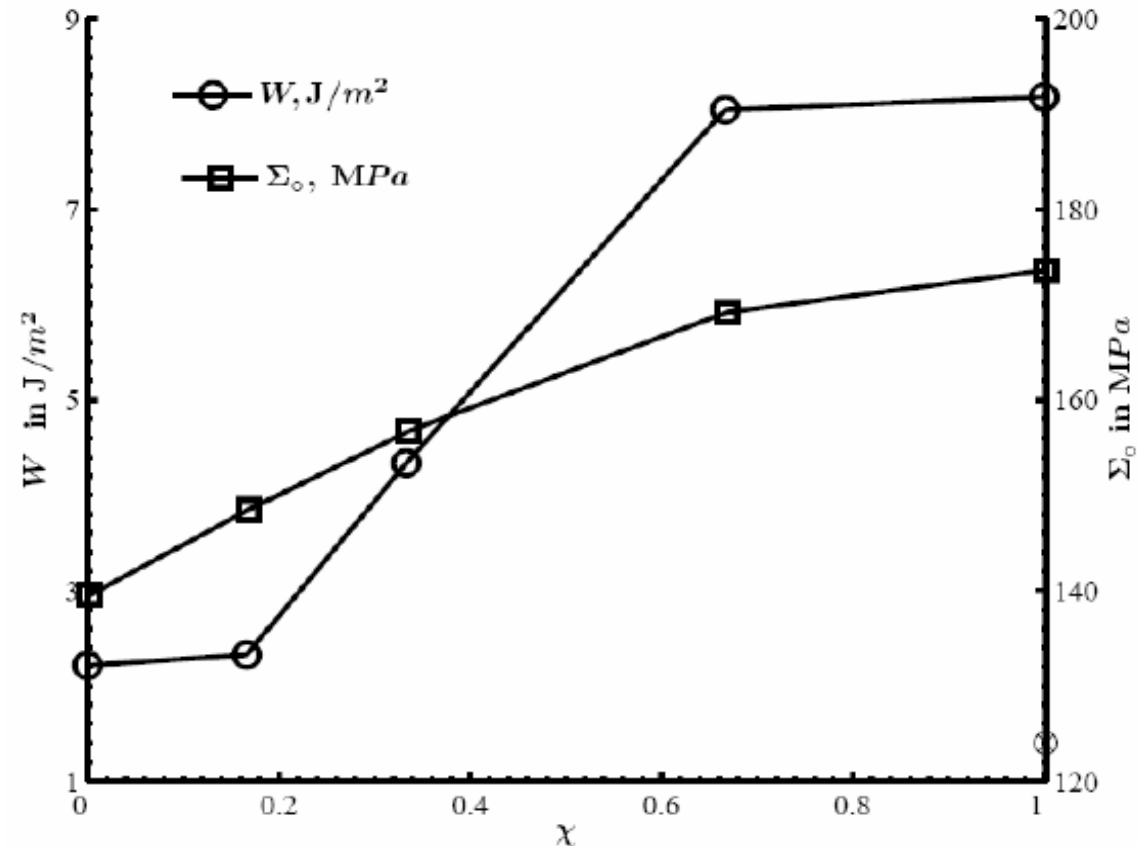


System without cross-links



Mechanical Properties of Epoxy Resin

Adhesion energy W and yield Σ_0 as function of degree of cross-linking

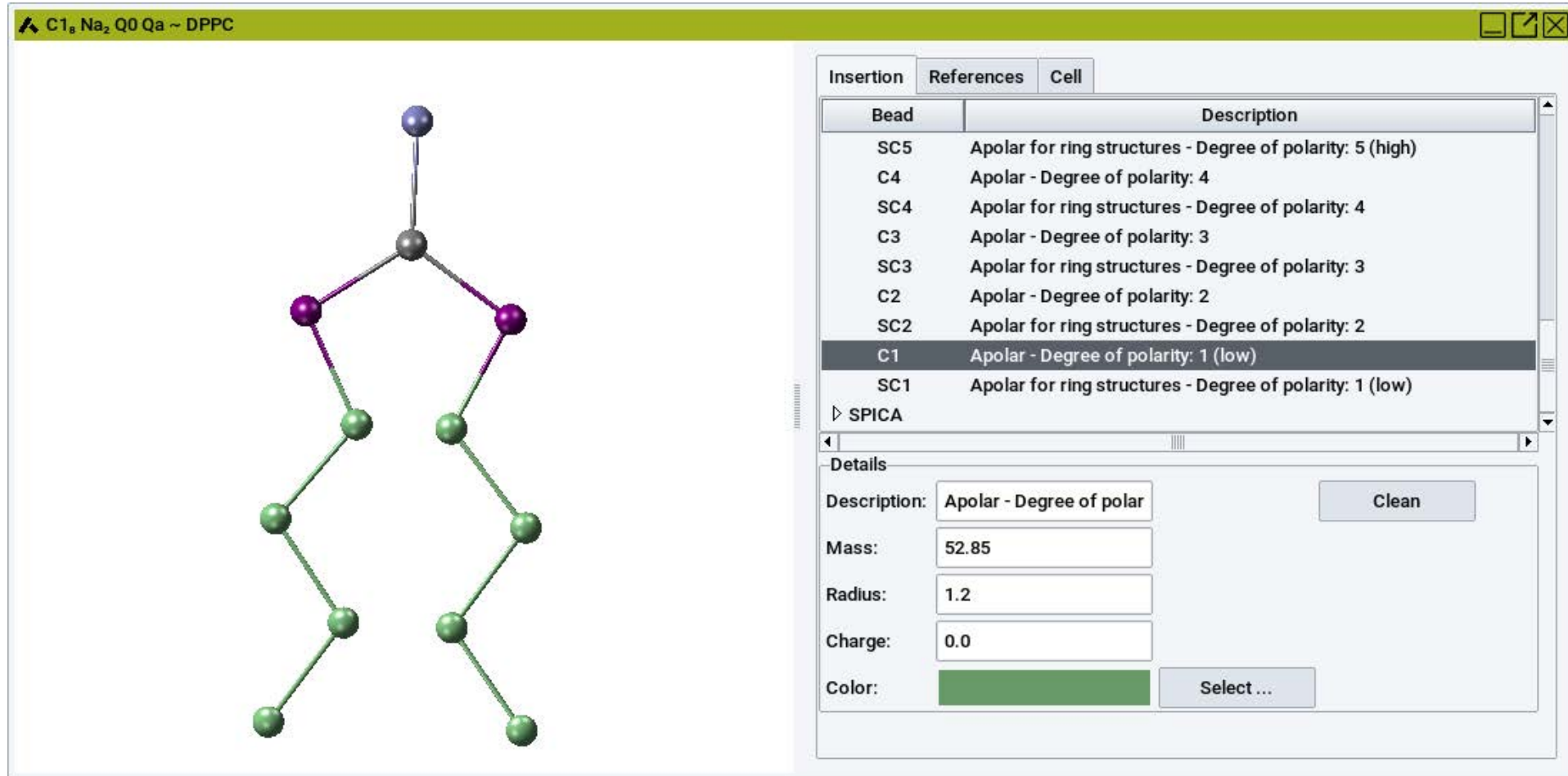


Adhesion energy: $W_{\text{calc}} = 8 \text{ J/m}^2$
 $W_{\text{exp}} = 2 \dots 25 \text{ J/m}^2$



Mesoscale Modeling With *MedeA* 3.1

Mesoscale Modeling With *MedeA* 3.1



Coarse-grained DPPC molecule

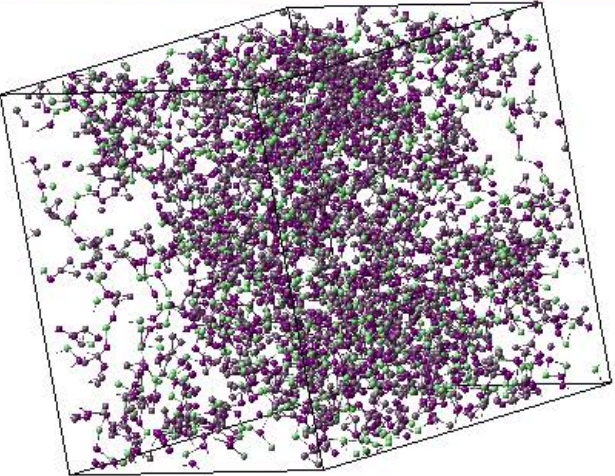


Mesoscale Modeling With *MedeA* 3.1

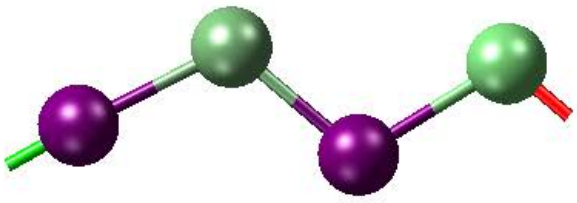
MedeA -- [(C1₄ C1R₁₅ Na₃₀ SC4₃₃)₄₈ (P1) ~ ANPN_initial]

File Edit Builders View Tools Jobs Forcefields Analysis Windows Help

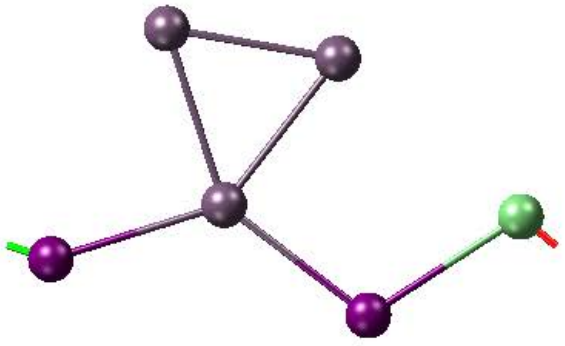
[(C1₄ C1R₁₅ Na₃₀ SC4₃₃)₄₈ (P1) ~ ANPN_initial] [(NO)₃ ~ HMMM]



C1 C1R Na₂ ~ AN-monomer



C1R Na₂ SC4₃ ~ PN-monomer



36

Mesoscale Modeling With *MedeA* 3.1

LAMMPS Flowchart for stage 1

Start

Initialize
3-d periodic
Cutoff: 12
Skin: 2.0
Long range: PPPM

Minimize
Optimization of atom positions,
Method: Conjugate gradients
Econvergence = 0.0
Fconvergence = 1.0

velocities
Initial velocities for \$T
No net translation
Random seed: 72489

NPT
Temp: \$T
Press: \$P
Time: 100 ns
Step: \$tstep
Constraints: isotropic
Control: Nose-Hoover T & P
Sampling: 10000 samples
Trajectory: 100 frames

NPT
Temp: \$T -> 300 K
Press: \$P
Time: 50 ns
Step: \$tstep
Constraints: isotropic
Control: Nose-Hoover T & P
Sampling: 10000 samples
Trajectory: 100 frames

Add stages

- Initialization: Initialize LAMMPS
- Bias: Orientation
- Single Point: Single Point Energy, Single Point Forces
- Minimization: Minimize
- Building and Editing: Set cell, Compress Layer
- Dynamics: Initialize velocities, NVE ensemble, NVT ensemble, NPT ensemble, Cohesive energy density, Thermal Conductivity, Viscosity, Diffusion, Surface Tension, Deposition
- Custom

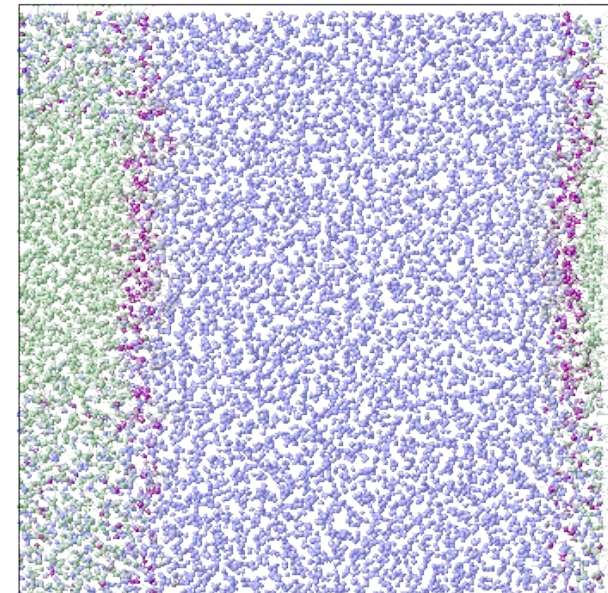
Job title: ANPN melt +


Run OK Cancel Help

Mesoscale Modeling With *MedeA* 3.1

► *MedeA* 3.1 supports

- Sketching of mesoscale systems
- MARTINI and SPICA forcefields
- Creation of user defined bead libraries and forcefields
- Building of polymers, amorphous systems and thermosets for mesoscale systems
- LAMMPS simulations including Diffusion, Viscosity, Thermal conductivity, Surface tension
- Hill-Walpole bounds
- Mechanical properties
- Deformation





Materials Design UGM
NOW ONLINE
October 2020

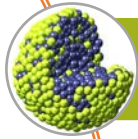
www.materialsdesign.com/ugm-2020



MedeA 3.1 Webinars



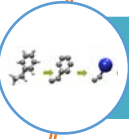
June 2020: Elasticity and Beyond – Predicting Mechanical Properties with *MedeA*, by Ray Shan



June 2020: Diffusion by Erich Wimmer and Benoît Minisini



July 2020: VASP 6 by Martjin Marsman



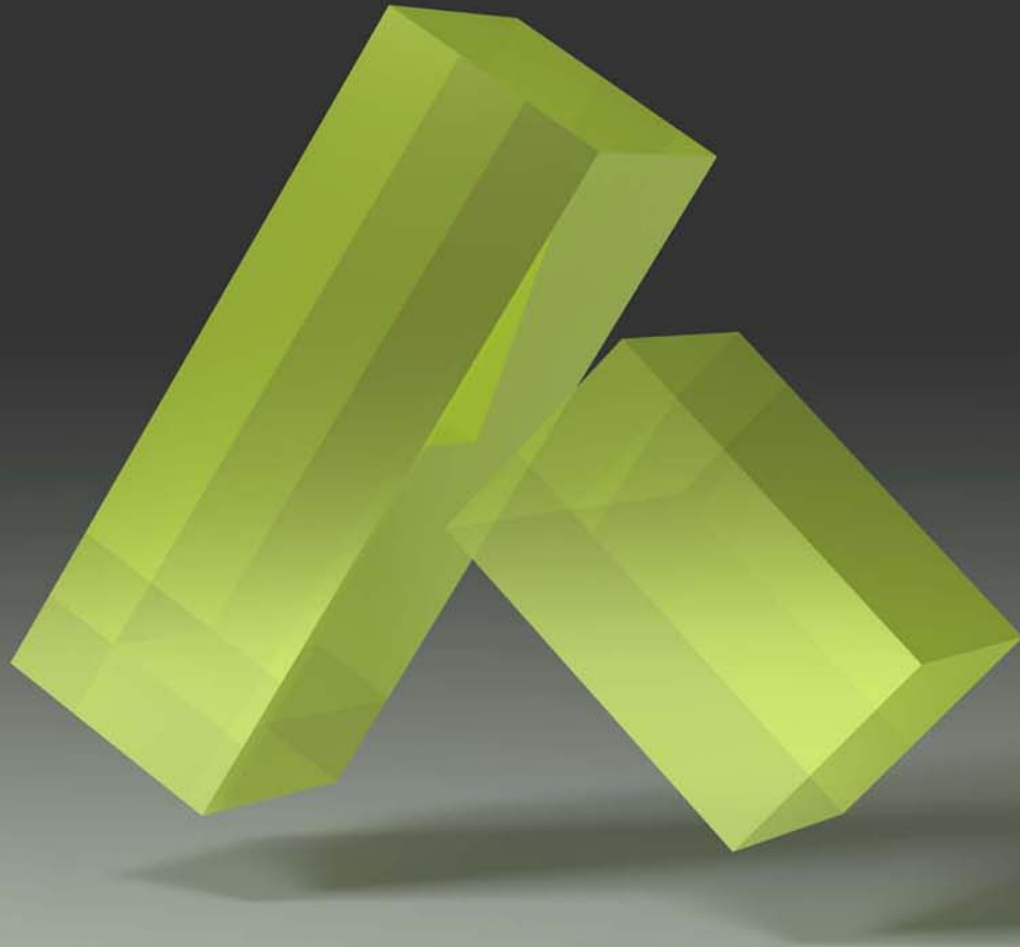
July 2020: Mesoscale Modeling by Jörg-Rüdiger Hill



August 2020: *MedeA* 3.1 by Marianna Yiannourakou, Walter Wolf and Jörg-Rüdiger Hill



Upcoming in the fall of 2020: Additional webinars addressing accuracy and larger scales



Medea

Innovation by Simulation