

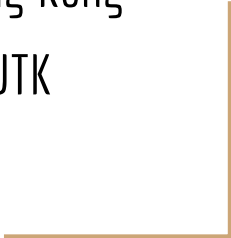
# Molecular Dynamics Simulations of Epoxy Resin Systems

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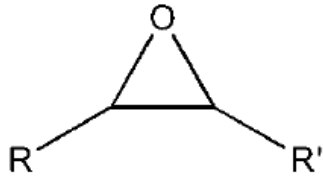
Mentor: Dr. Crosby: UTK

Aug 1, 2019



# Epoxy Resins

- Epoxy resins are a class of thermoset polymers.
- The epoxy resins can cross-link with amine hardeners, producing cured resins.
- Applications: adhesives, coatings, encapsulates, casting materials, etc.



Basic chemical structure of epoxy group

M. A. Boyle, et al. (2001).



<https://images-fibreglast-com.s3.amazonaws.com/pio-resized/750/System%202000%20Laminating%20Epoxy%20Resin-2.jpg>

# Advantages of Computational Experiments

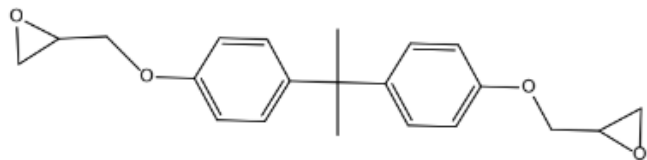
- Lack of materials costs
- Easier to alter experiments
- Growth of supercomputing access / power has helped make experiments have reasonable run time

## **Cons of Computational Experiments**

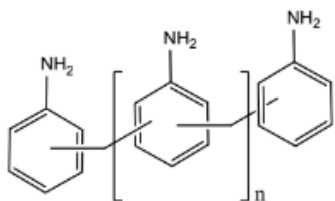
- Reliant on experimental results for validation
- Easy to simulate unphysical situations
- Reaction mechanism is not carried out as it would be in a physical system

# PRO-SET® M1002 Resin (Epoxy) and M2046 Hardener (Amine)

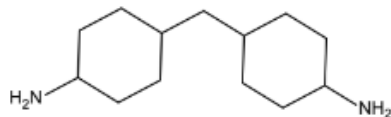
MSDS and Sigma Aldrich



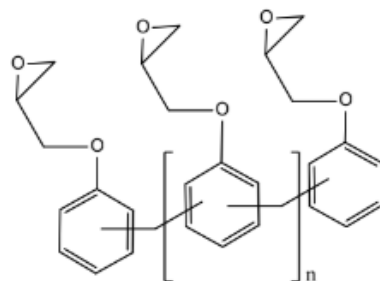
Propane, 2,2-bis[p-(2,3-epoxypropoxy)phenyl] [BADGE] (70-100%)



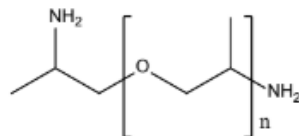
Benzenamine-formaldehyde polymer [Aniline formaldehyde] (15-35%)



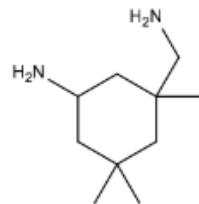
4, 4'-Methylenebiscyclohexanamine [Methylene-BCHA] (10-30%)



Phenol-formaldehyde polymer glycidyl ether [PDGE formaldehyde] (10-20%)

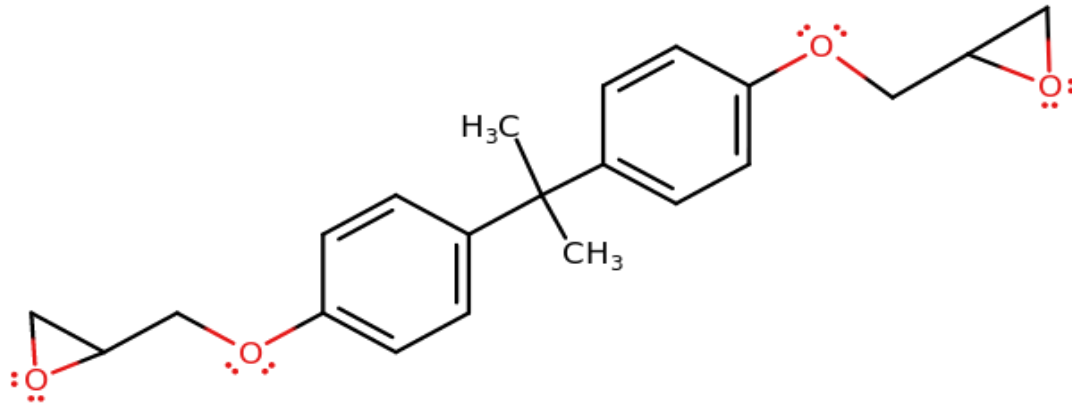


Polyoxypropylenediamine [POPDA] (10-30%)

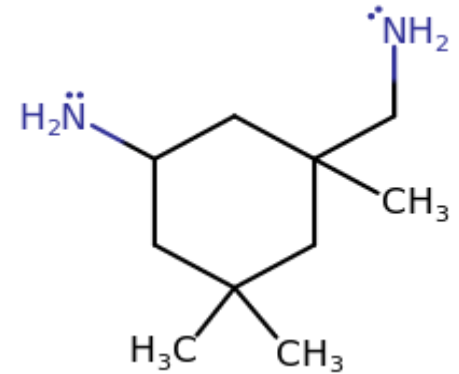


Isophoronediamine [IPDA] (10-30%)

# Binary System 1

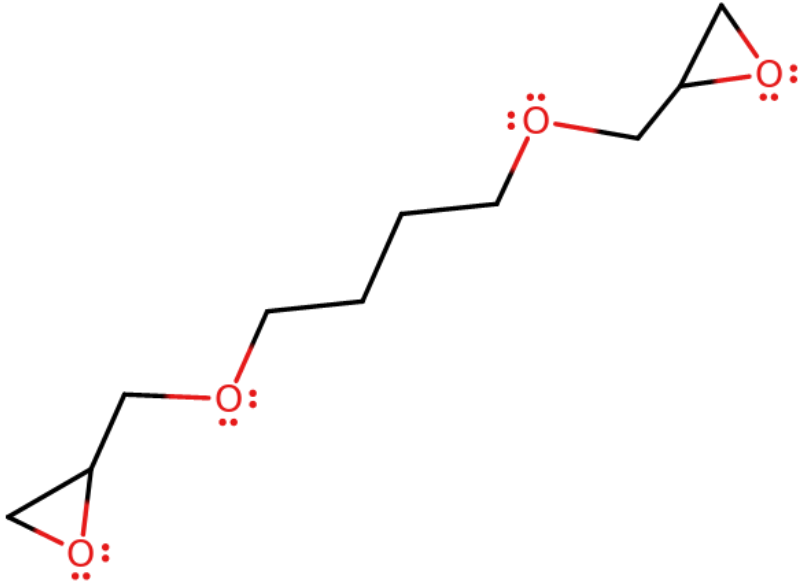


Propane, 2,2-bis[p-(2,3-Epoxypropoxy)phenyl] [BADGE]

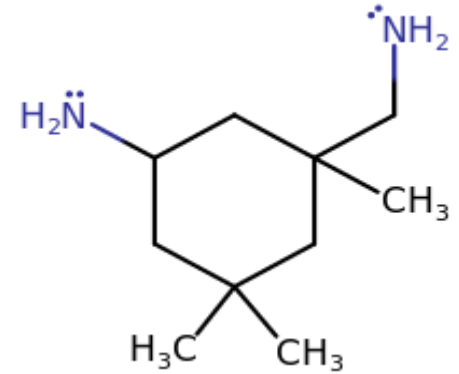


Isophoronediamine [IPDA]

# Binary System 2

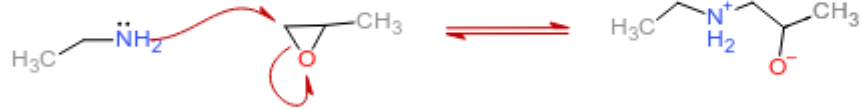


Diglycidyl ether of 1,4-butanediol (DGEBD)



Isophoronediamine  
[IPDA]

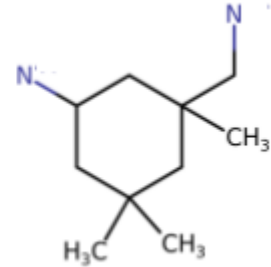
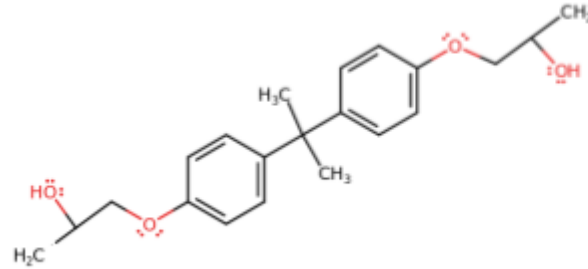
# Crosslinking Reaction



$$\text{crosslinking percentage} = 1 - \frac{\text{noncrosslinked carbon radicals}}{\text{total potential crosslinks}}$$

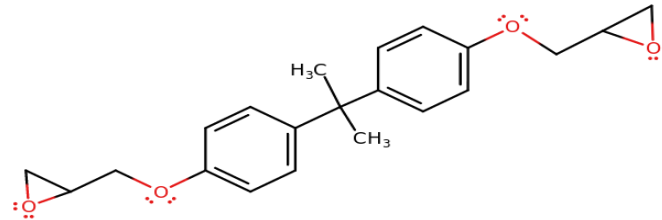
# Activated molecules

Activated

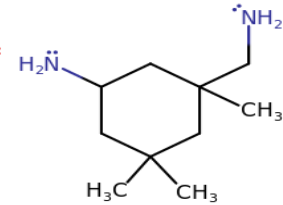


V.S.

Non-activated



Propane, 2,2-bis[p-(2,3-Epoxypropoxy)phenyl] [BADGE]



Isophoronediamine [IPDA]

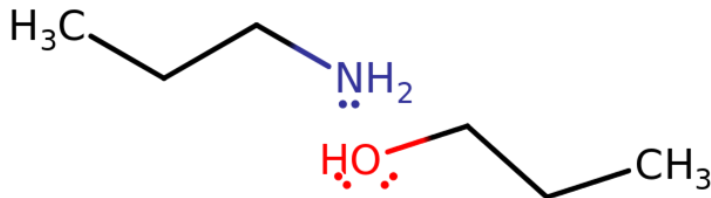


# Under the Hood of the Simulation

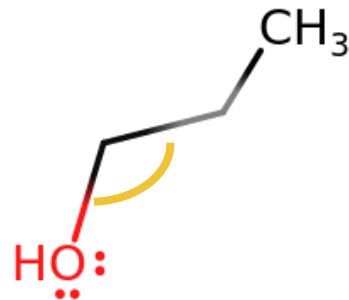
$$\begin{aligned}
 U_{\text{CHARMM}} = & \sum_{\text{bonds}} K_b(b - b_0)^2 \\
 & + \sum_{\text{angles}} K_\theta(\theta - \theta_0)^2 \\
 & + \sum_{\text{dihedrals}} K_\phi(1 + \cos(n\phi - \delta)) \\
 & + \sum_{\text{nonb,pair}} \frac{q_i q_j}{4\pi D r_{ij}} \\
 & + \sum_{\text{nonb,pair}} \varepsilon_{ij} \left[ \left( \frac{R_{\text{min},ij}}{r_{ij}} \right)^{12} - 2 \left( \frac{R_{\text{min},ij}}{r_{ij}} \right)^6 \right]
 \end{aligned}$$

Vanommeslaeghe, K., et al. (2010).

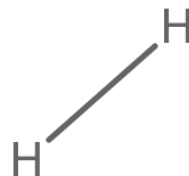
The CHARMM force field used in our simulations



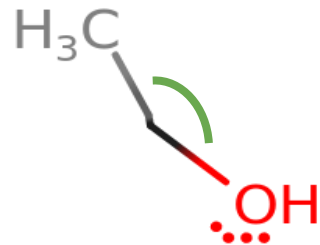
Nitrogen and Oxygen act as a Non-Bonded Pair



Angle



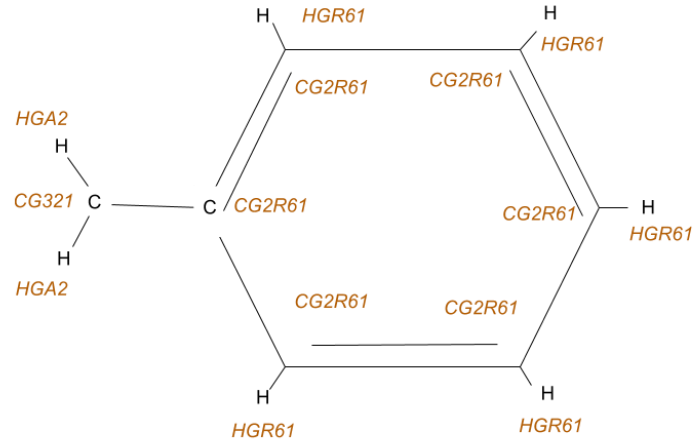
Bond



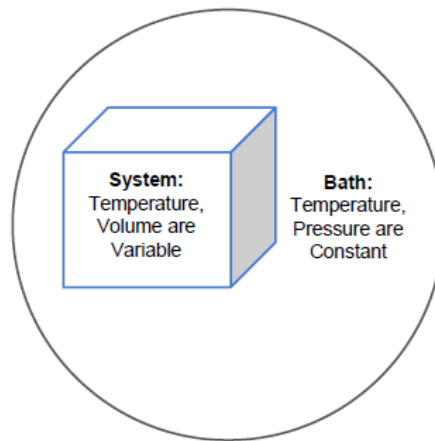
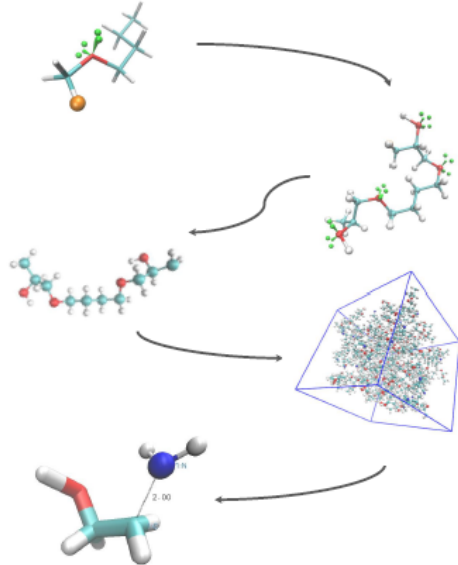
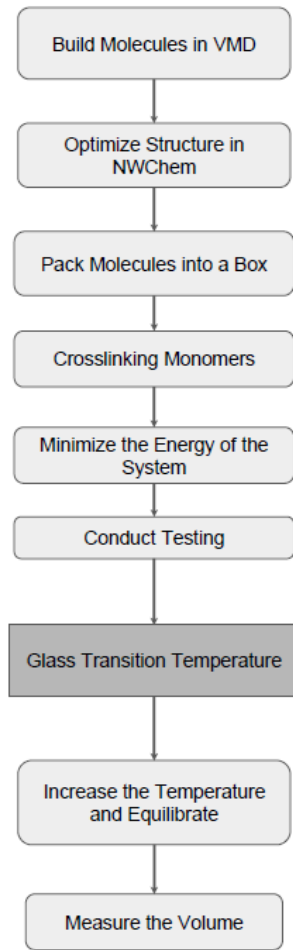
Dihedral / Torsion

# Encode Atoms (Parameterization)

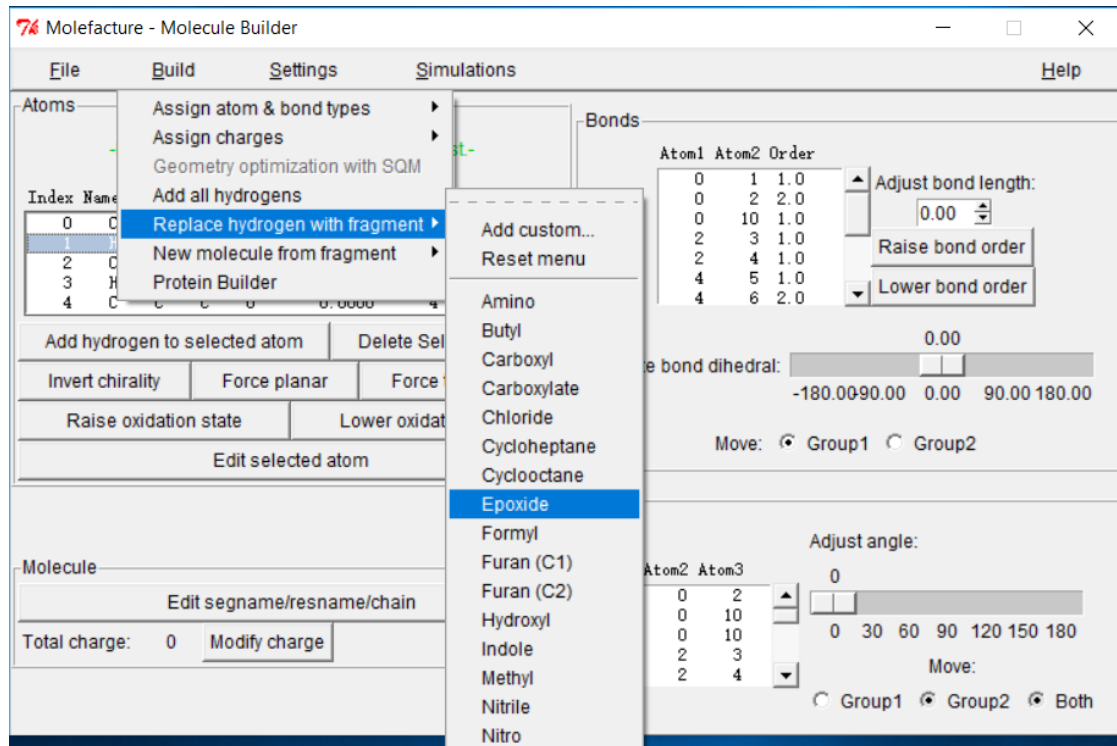
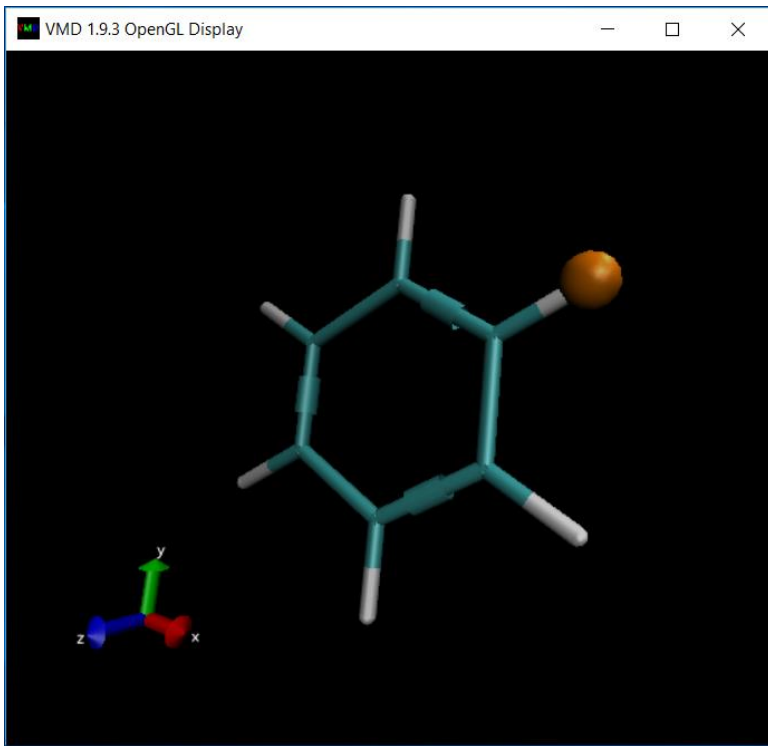
- First letter is atomic element
  - CG321 -> Carbon
- Letters and numbers after refer to specific types of each atom.
  - CG321 -> G321 type of Carbon
- Other encoding includes partial charge
  - CG321Z0.06 -> Charge of 0.06
  - CG321Z-0.06 -> Charge of -0.06



# Workflow



# Building Molecules in VMD



Molecule Builder

File Build Settings Simulations Help

Atoms

- Assign atom & bond types
- Assign charges
- Geometry optimization with SQM
- Add all hydrogens
- Replace hydrogen with fragment**
- New molecule from fragment
- Protein Builder

Index Name

Index	Name
0	C
1	H
2	C
3	H
4	C

Add hydrogen to selected atom Delete Sel

Invert chirality Force planar Force

Raise oxidation state Lower oxidat

Edit selected atom

Molecule

Edit segname/resname/chain

Total charge: 0 Modify charge

Bonds

Atom1	Atom2	Order
0	1	1.0
0	2	2.0
0	10	1.0
2	3	1.0
2	4	1.0
4	5	1.0
4	6	2.0

Adjust bond length: 0.00

Raise bond order

Lower bond order

Bond dihedral: 0.00

-180.00 90.00 0.00 90.00 180.00

Move:  Group1  Group2

Adjust angle: 0

Atom2	Atom3
0	2
0	10
0	10
2	3
2	4

0 30 60 90 120 150 180

Move:  Group1  Group2  Both

Amino

Butyl

Carboxyl

Carboxylate

Chloride

Cycloheptane

Cyclooctane

**Epoxide**

Formyl

Furan (C1)

Furan (C2)

Hydroxyl

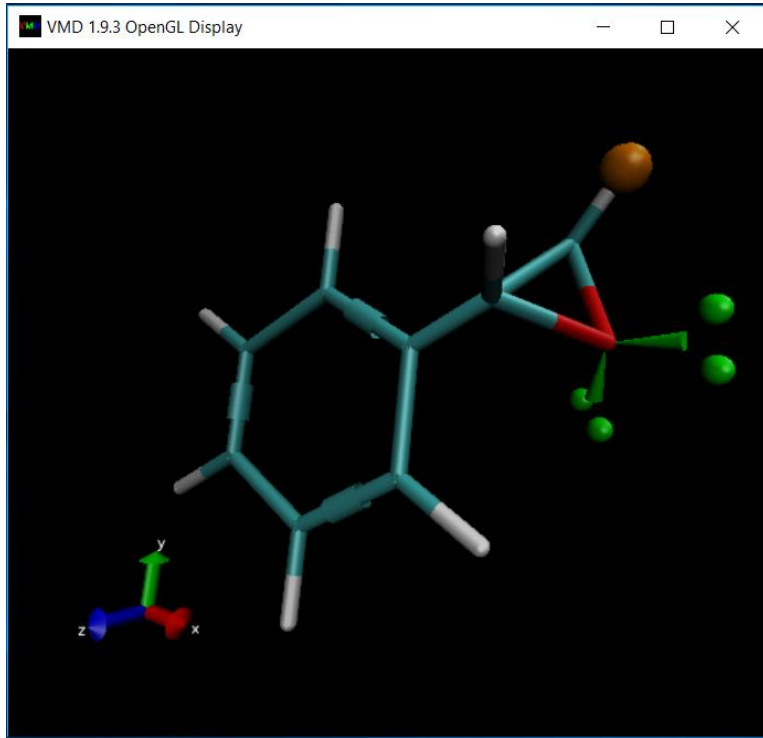
Indole

Methyl

Nitrile

Nitro

# Building Molecules in VMD



By repeatedly replacing the atoms with functional groups, we can build complicated molecular structure.

# Molecular Structure Optimization

- We adopted the NWChem program to perform structural geometry optimization.
- The optimization is based on density functional theory (DFT), which is a quantum mechanical method widely used in computational chemistry.
- Through the optimization, the molecules will become more stable.

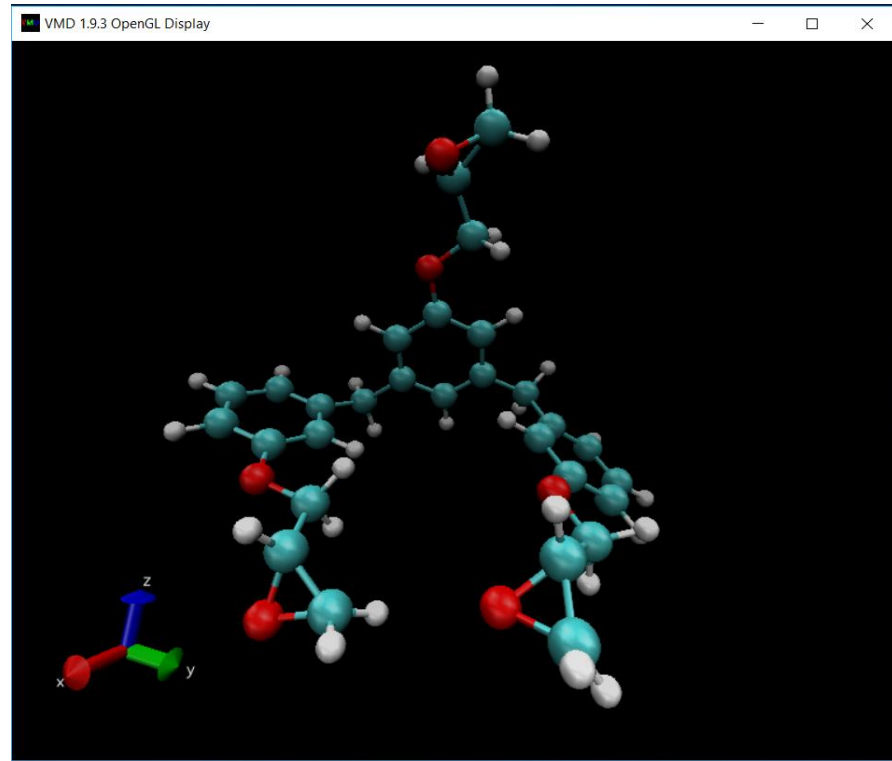
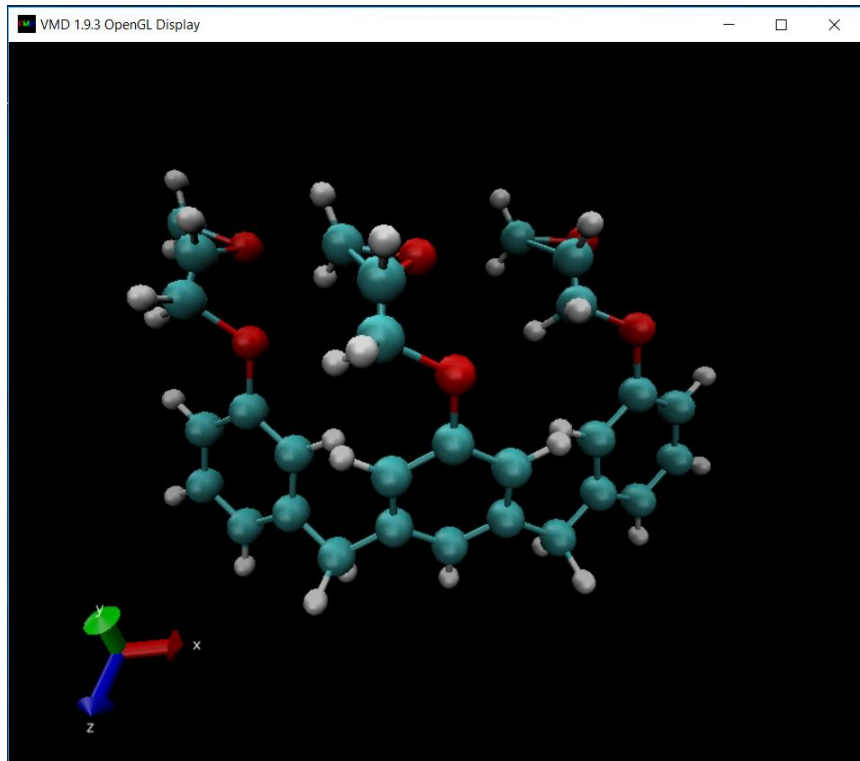


**NWCHEM**

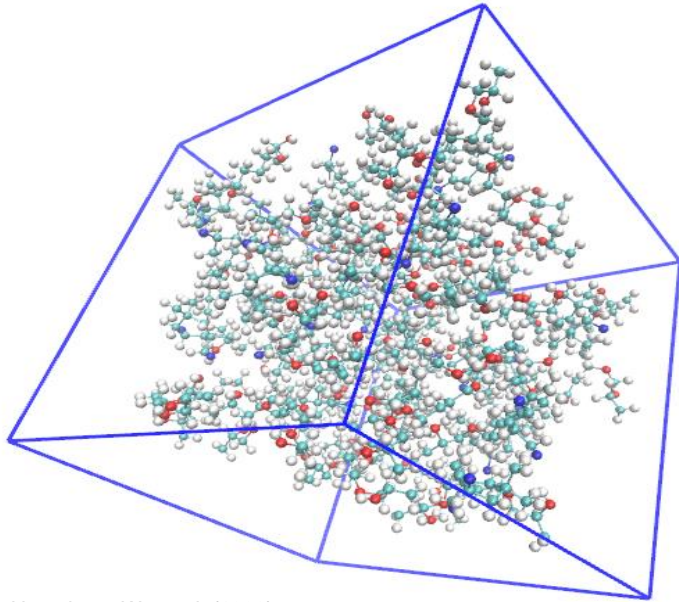
HIGH-PERFORMANCE COMPUTATIONAL  
CHEMISTRY SOFTWARE

M. Valiev, et al. (2010).

# Molecular Structure Optimization



# Pack molecules into a box



Humphrey, W., et al. (1996).

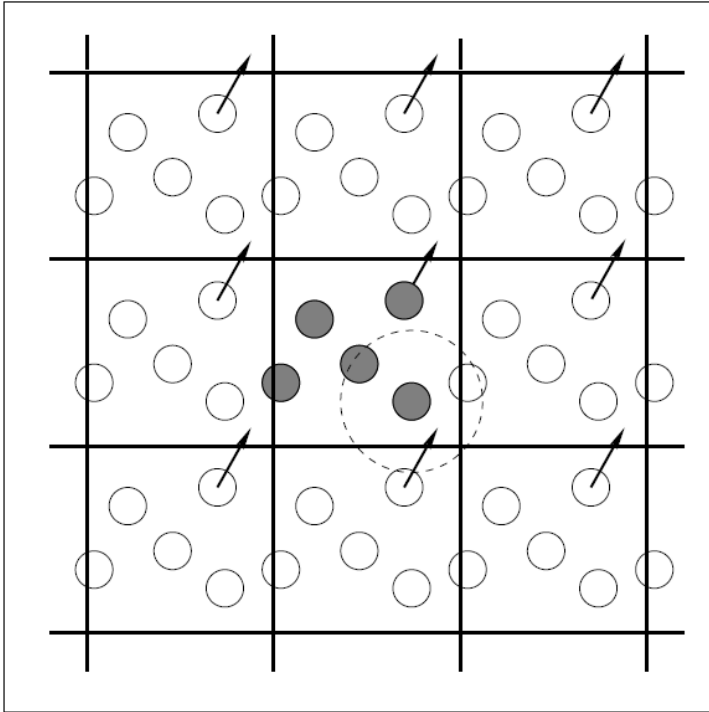
We built a simulation box with Packmol program.

Crosslinking reaction will be conducted within the box.

Periodic boundary condition will be applied in the simulation.



# Periodic Boundary Condition

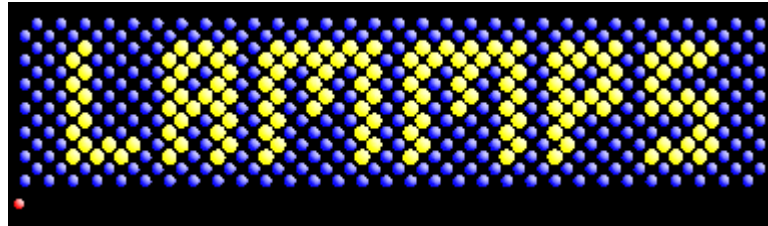


Up to now, it's still not realistic for the computer to simulate a system containing atoms on the order of Avogadro's number ( $6.02 \times 10^{23}$ ).

With periodic boundary condition, we can "enlarge" the small simulation box.

# LAMMPS

- Large-Scale Atomic/Molecular Massively Parallel Simulator
- Customizable to a wide variety of experiments and fields of study



S. Plimpton. (1995).

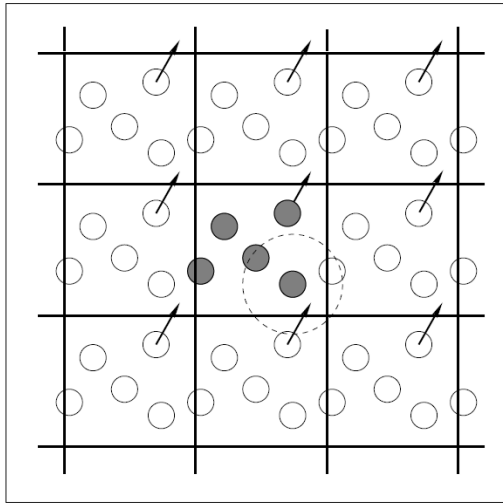
# Simulation Procedure

$$1\text{fs} = 10^{-15}\text{s}; 1\text{ps} = 10^{-12}\text{s}$$

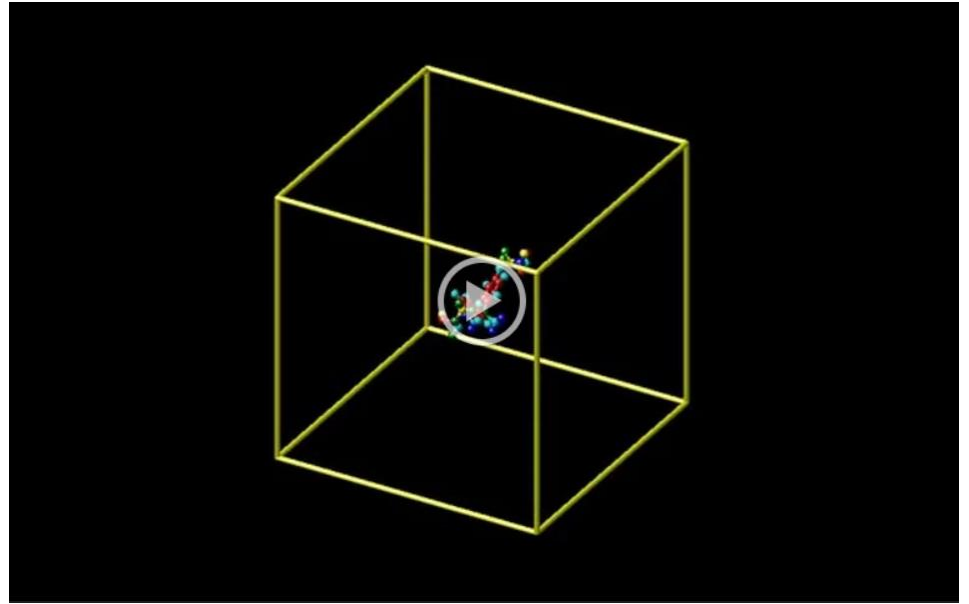
1. Set the length of a timestep to be 0.5fs.
2. Perform energy minimization on the simulation box.
3. Equilibrate the system at 800 Kelvin, 1 atm, for 100 ps in canonical (NVT) ensemble followed by 400ps in isothermal–isobaric (NPT) ensemble.
4. Cool down the system from 800K to 10K with an interval of 10K. At each temperature, run 10 ps of NVT ensemble followed by 40ps of NPT ensemble. The volume is averaged over the last 2.5ps of the NPT simulation.

# Issues Faced in LAMMPS

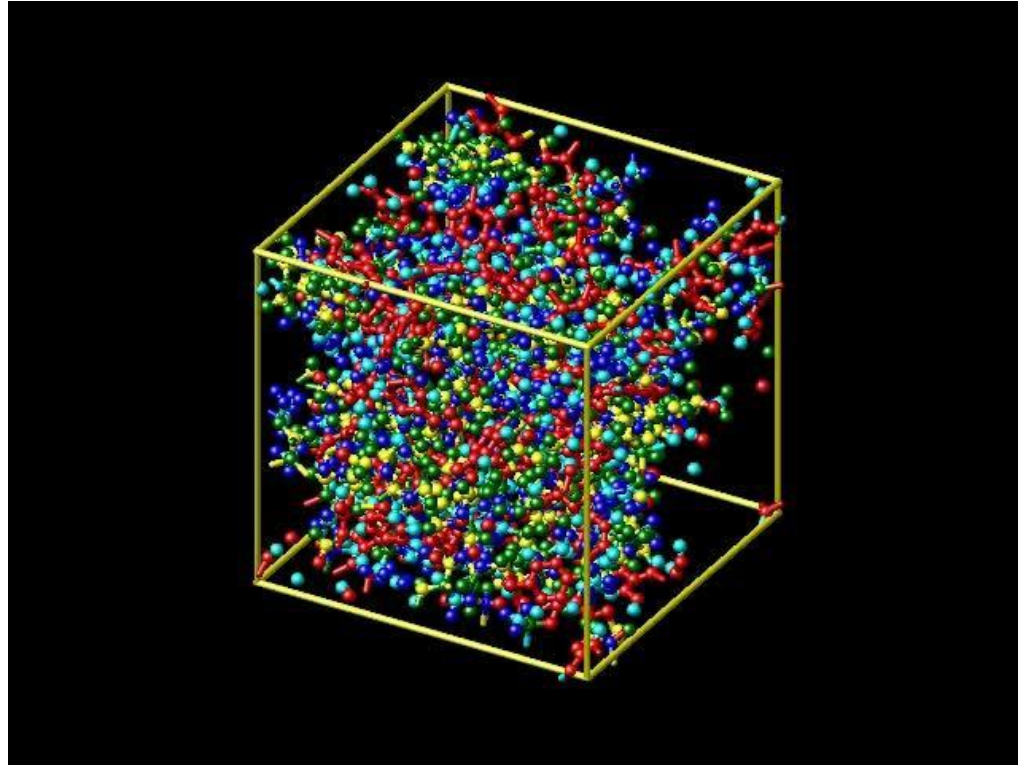
- Mistyping/ Improper reading of input data types
- Atom Bonds not on processor 3



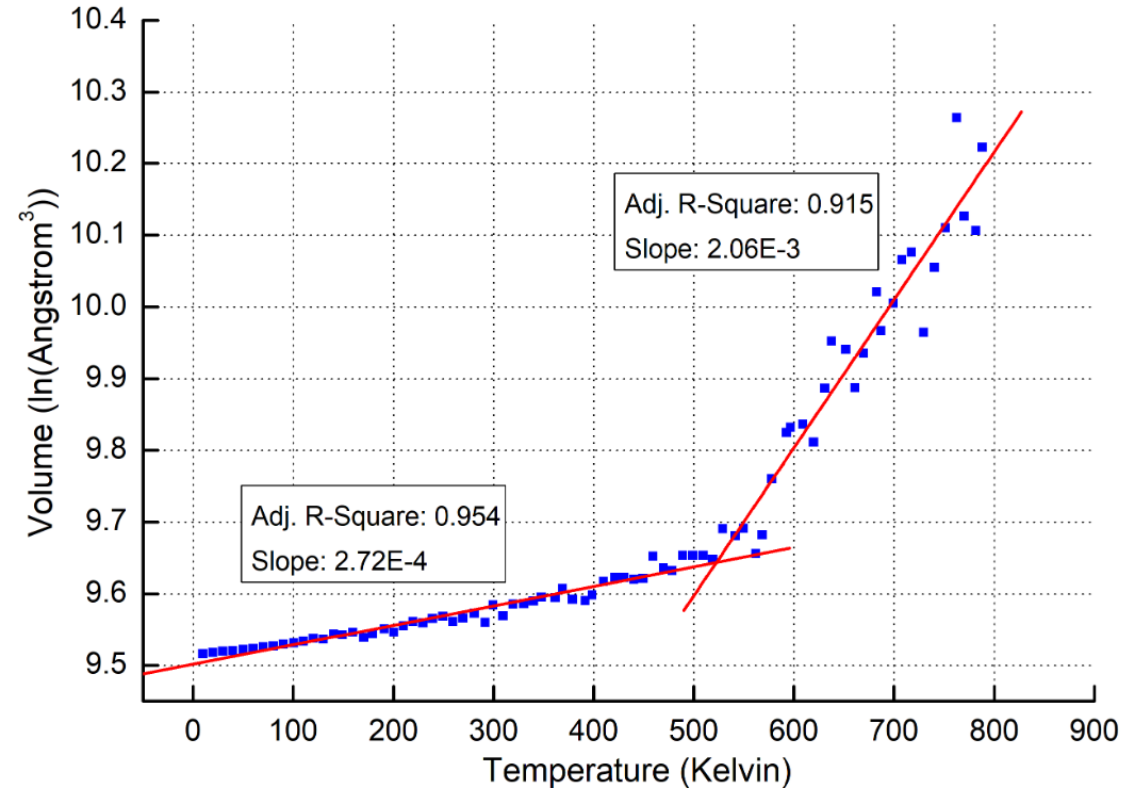
Allen, M. P. (2004).



# Cooling Down the System



# Results: BADGE-IPDA

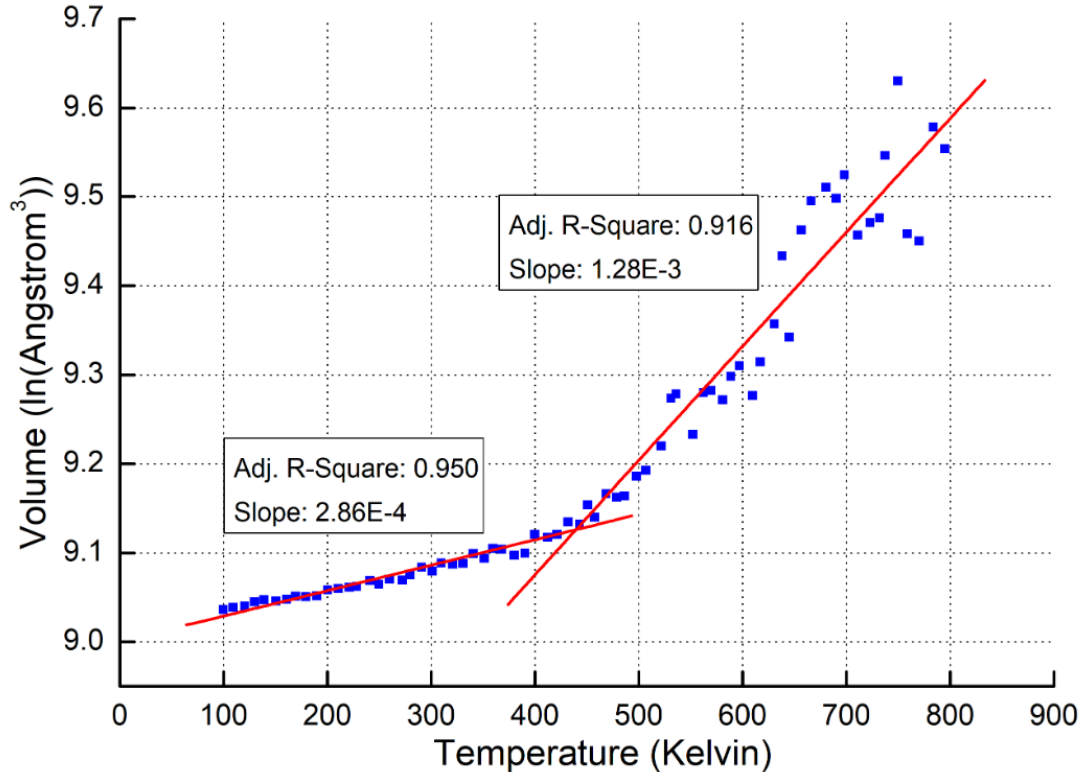


For the 90% crosslinked BADGE-IPDA system, we measured the glass transition temperature to be 524.06K (experimental value: 436K).

The thermal expansion coefficient ( $\alpha$ ) we measured in glassy state is  $2.72e-4 \text{ K}^{-1}$ , while in rubbery state is  $2.06e-3 \text{ K}^{-1}$ .

$$\alpha = \frac{1}{V} \left( \frac{\partial V}{\partial T} \right)_P = \left( \frac{\partial \ln(V)}{\partial T} \right)_P$$

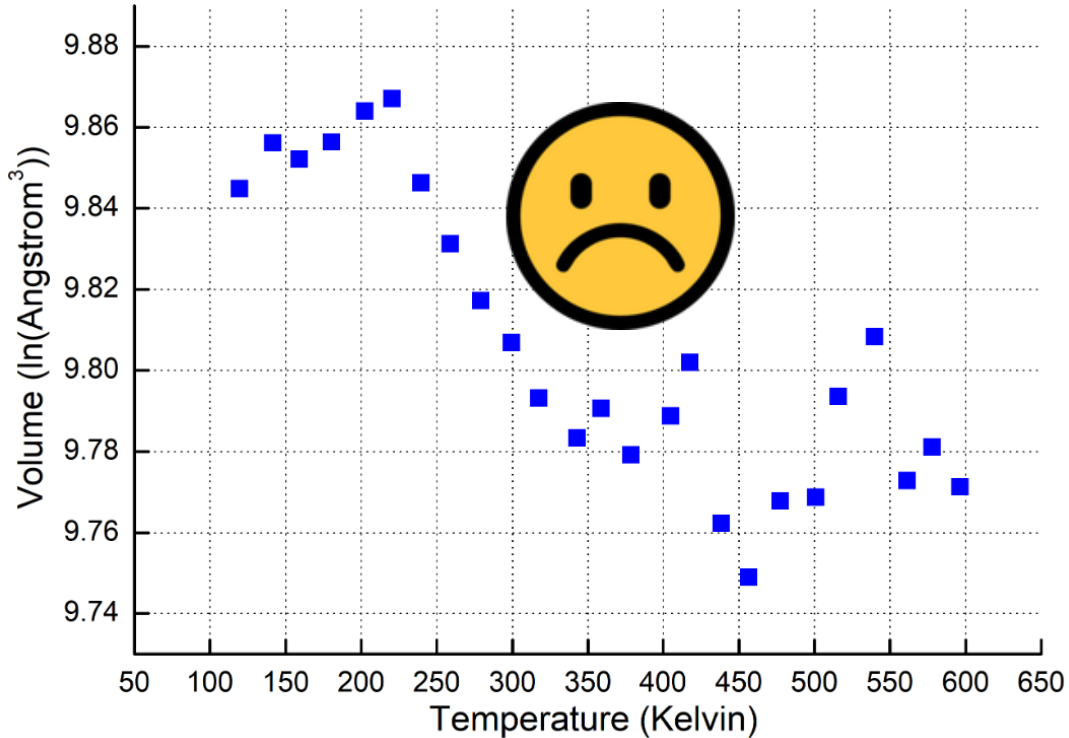
# Results: DGEBD-IPDA



As for the 90% crosslinked DGEBD-IPDA system, we measured the glass transition temperature to be 439.86K (experimental value: 326K).

The thermal expansion coefficient we measured in glassy state is  $2.86e-4 \text{ K}^{-1}$ , while in rubbery state is  $1.28e-3 \text{ K}^{-1}$ .

# Results



## Why cooling down the system?

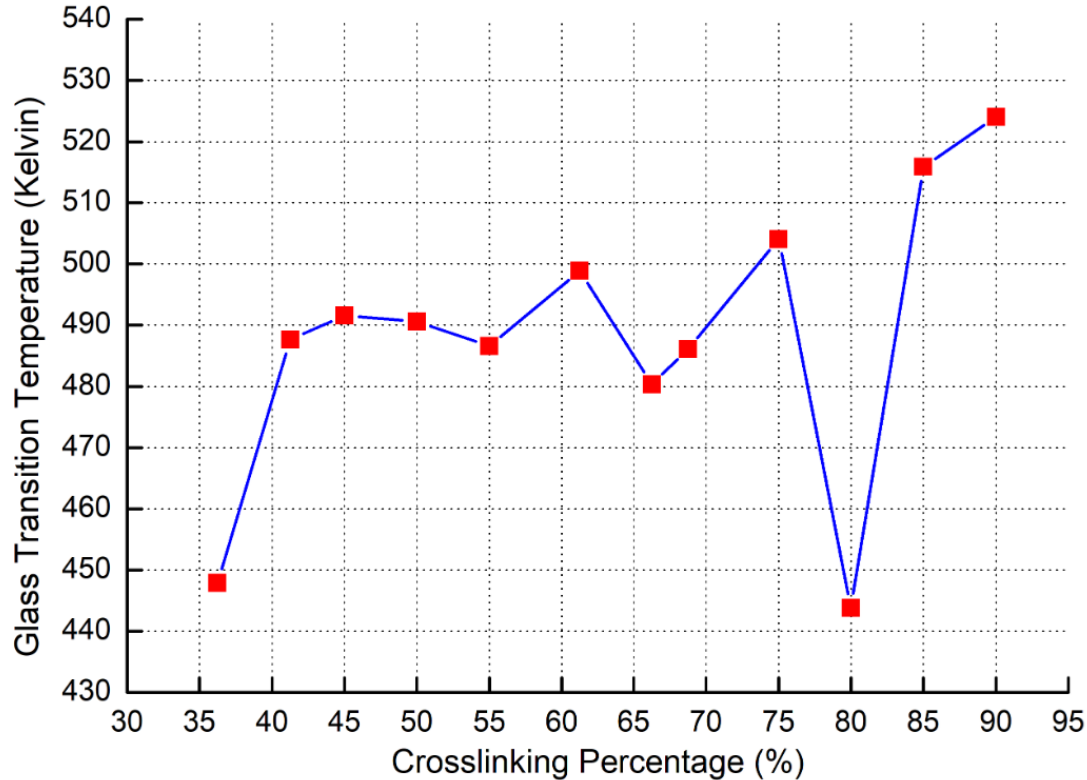
At low temperature, the kinetic energy of molecules is low.

The system needs more time to reach the equilibrium.

For heating up the system from low temperature, if the simulation time is short, we will obtain incorrect results!

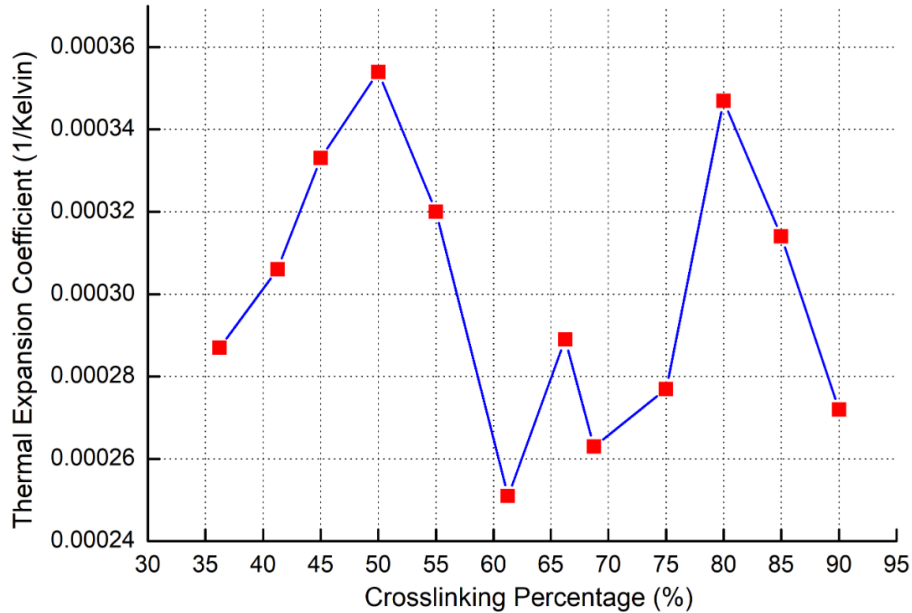


# Results: Crosslinking percentage v.s. $T_g$

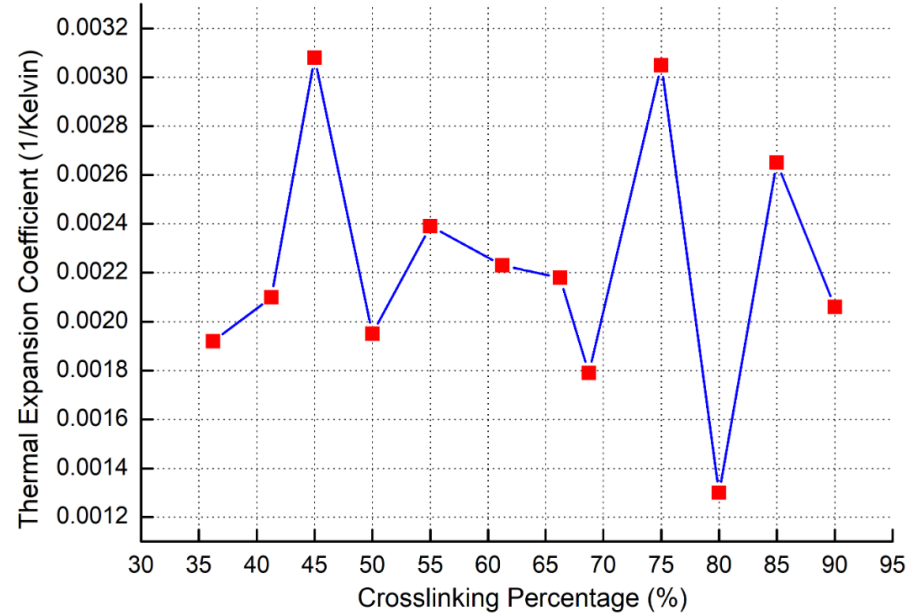


The effect of crosslinking percentage on glass transition temperature of the BADGE-IPDA system.

# Results: Crosslinking percentage v.s. $\alpha$



In glassy state



In rubbery state

# Future Work

Use the methods developed over the course of the summer to work on systems that have unknown properties.

Find the reason why the glass transition temperatures are larger than the experimental measurements.

Use larger volumes of the same system to see if results are replicable for computations involving a larger system.

Investigate CGenFF in depth: Automatic Atom Typing Software.

# References

- Allen, M. P. (2004). Introduction to Molecular Dynamics Simulation.
- Epoxy Resins picture. Retrieved from <https://images-fibreglast-com.s3.amazonaws.com/pio-resized/750/System%202000%20Laminating%20Epoxy%20Resin-2.jpg>
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