

# CE 530 Molecular Simulation

## Lecture 14 Molecular Models

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# Review

## ○ Monte Carlo

- *ensemble averaging, no dynamics*
- *easy to select independent variables*
- *lots of flexibility to improve performance*

## ○ Molecular dynamics

- *time averaging, yields dynamical properties*
- *extended Lagrangians permit extension to other ensembles*

## ○ Models

- *atomic systems only*
  - hard sphere, square well
  - Lennard-Jones

# Modeling Molecules

- Quantitative calculations require more realistic treatment of molecular interactions
- Quantum mechanical origins
- Intermolecular forces
- Intramolecular forces
- Effects of long-range interactions on properties
- Multibody interactions

# Quantum Mechanical Origins

## ○ Fundamental to everything is the Schrödinger equation

- $H\Psi = i\hbar \frac{\partial \Psi}{\partial t}$  *Nuclear coordinates*
- *wave function*  $\Psi(R, r, t)$
- $H = \text{Hamiltonian operator}$  *Electronic coordinates*

$$H = K + U = -\frac{\hbar^2}{2m} \sum \nabla_i^2 + U$$

- *time independent form*

$$H\Psi = E\Psi$$

## ○ Born-Oppenheimer approximation

- *electrons relax very quickly compared to nuclear motions*
- *nuclei move in presence of potential energy obtained by solving electron distribution for fixed nuclear configuration*  
*it is still very difficult to solve for this energy routinely*
- *usually nuclei are heavy enough to treat classically*

# Force Field Methods

- Too expensive to solve QM electronic energy for every nuclear configuration
- Instead define energy using simple empirical formulas
  - “force fields” or “molecular mechanics”

- Decomposition of the total energy

$$U(\mathbf{r}^N) = \sum_i \boxed{u^{(1)}(\mathbf{r}_i)} + \sum_i \sum_{j < i} \boxed{u^{(2)}(\mathbf{r}_i, \mathbf{r}_j)} + \sum_i \sum_{j < i} \sum_{k < j} \boxed{u^{(3)}(\mathbf{r}_i, \mathbf{r}_j, \mathbf{r}_k)} + K$$

Single-atom energy  
(external field)

Atom-pair contribution

3-atom contribution

*Neglect 3- and  
higher-order terms*

- Force fields usually written in terms of pairwise additive interatomic potentials
  - with some exceptions

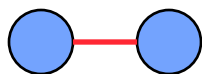
# Contributions to Potential Energy

- Total pair energy breaks into a sum of terms

$$U(\mathbf{r}^N) = U_{str} + U_{bend} + U_{tors} + U_{cross} + U_{vdW} + U_{el} + U_{pol}$$

*Intramolecular only*

- $U_{str}$  stretch



- $U_{vdW}$  van der Waals

- $U_{bend}$  bend

- $U_{el}$  electrostatic

- $U_{tors}$  torsion

- $U_{pol}$  polarization

- $U_{cross}$  cross

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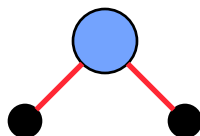
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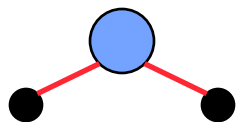
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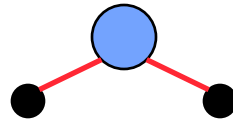
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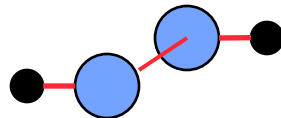
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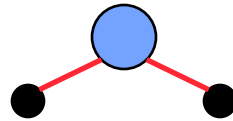
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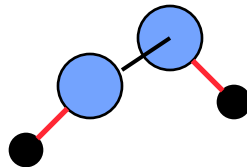
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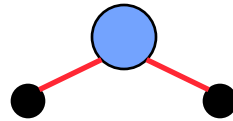
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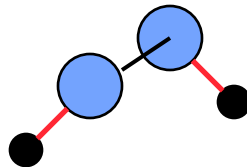
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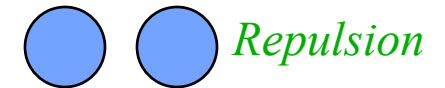


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- $U_{cross}$  cross *Mixed terms*

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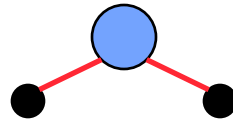
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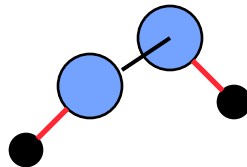
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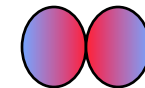


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*Repulsion*

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- $U_{pol}$  polarization

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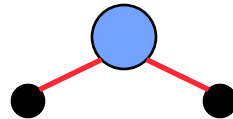
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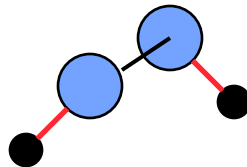
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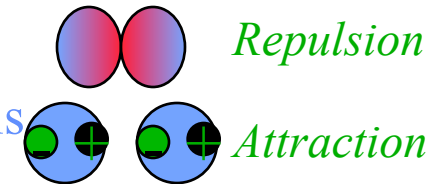


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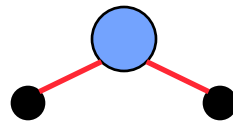
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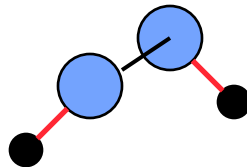
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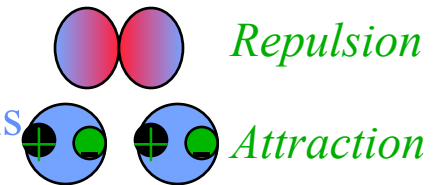


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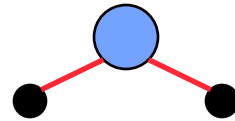
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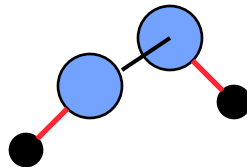
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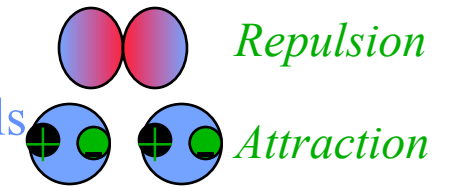


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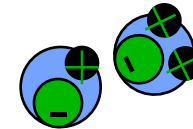


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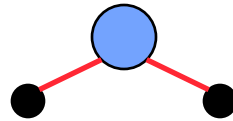
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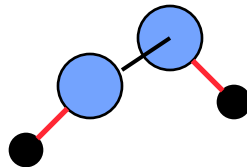
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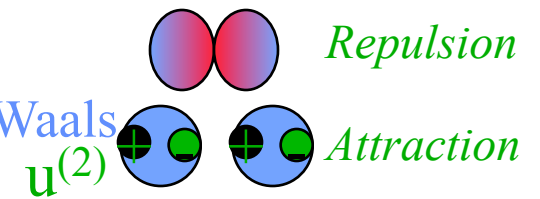


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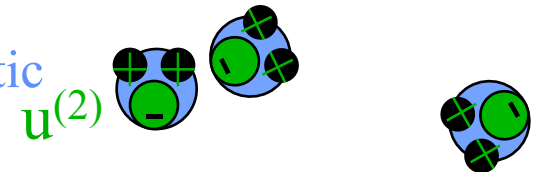


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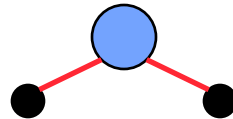
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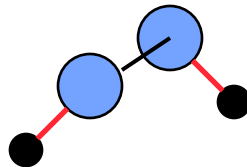
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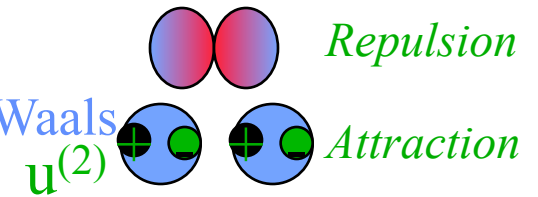


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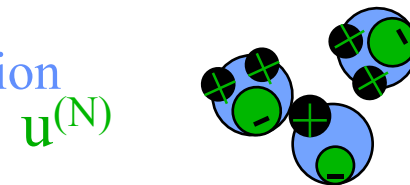
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# Stretch Energy



- Expand energy about equilibrium position

$$U(r_{12}) = U(r_{12}^o) + \frac{dU}{dr} \Big|_{r=r^o} (r_{12} - r_{12}^o) + \frac{d^2U}{dr^2} \Big|_{r=r^o} (r_{12} - r_{12}^o)^2 + K \quad (\text{neglect})$$

define      minimum

$$U(r_{12}) = k(r_{12} - r_{12}^o)^2 \quad \text{harmonic}$$

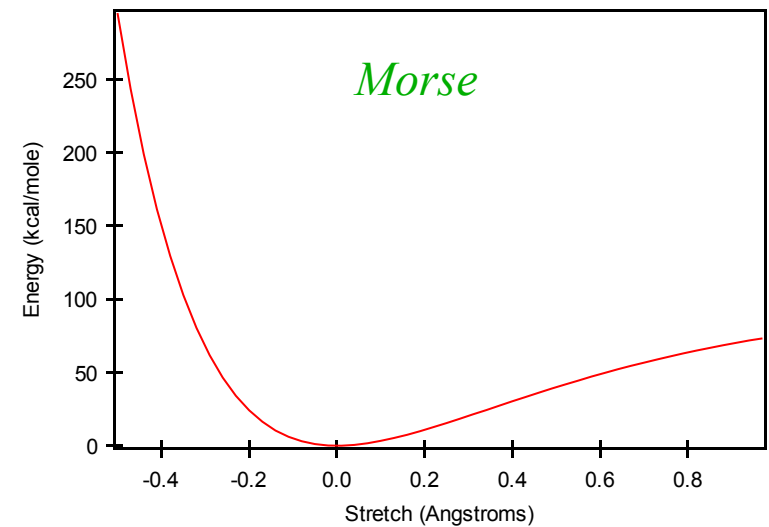
- Model fails in strained geometries

- better model is the Morse potential

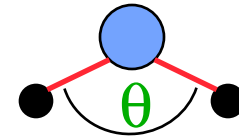
$$U(r_{12}) = D(1 - e^{-\alpha r_{12}})^2$$

*dissociation  
energy*

*force constant*



# Bending Energy



- Expand energy about equilibrium position

$$U(\theta) = U(\theta^o) + \left. \frac{dU}{d\theta} \right|_{\theta=\theta^o} (\theta - \theta^o) + \left. \frac{d^2U}{d\theta^2} \right|_{\theta=\theta^o} (\theta - \theta^o)^2 + K \quad (\text{neglect})$$

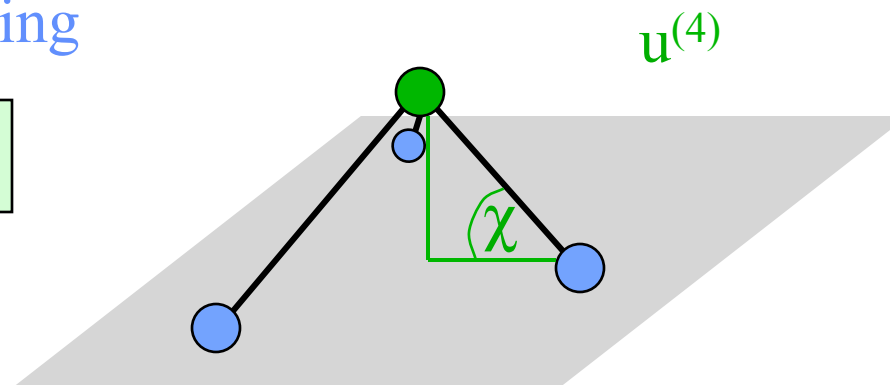
*define*      *minimum*

$$U(\theta) = k(\theta - \theta^o)^2 \quad \text{harmonic}$$

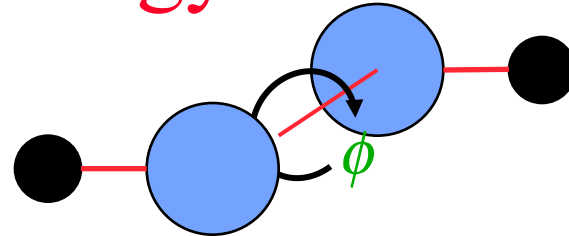
- *improvements based on including higher-order terms*

- Out-of-plane bending

$$U(\chi) = k(\chi - \chi^o)^2$$



# Torsional Energy



## ○ Two new features

- *periodic*
- *weak (Taylor expansion in  $\phi$  not appropriate)*

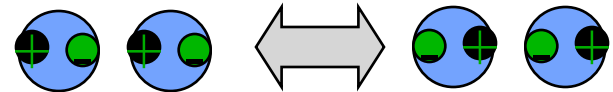
## ○ Fourier series

$$U(\phi) = \sum_{n=1} U_n \cos(n\phi)$$

- *terms are included to capture appropriate minima/maxima*
  - depends on substituent atoms*
    - e.g., ethane has three minimum-energy conformations
      - $n = 3, 6, 9$ , etc.
    - depends on type of bond*
      - e.g. ethane vs. ethylene
- *usually at most  $n = 1, 2$ , and/or  $3$  terms are included*

# Van der Waals Attraction

○ Correlation of electron fluctuations



○ Stronger for larger, more polarizable molecules

- $CCl_4 > CH_4$ ;  $Kr > Ar > He$

○ Theoretical formula for long-range behavior

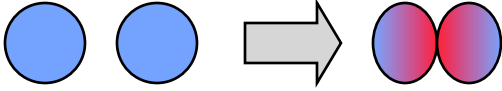
$$U_{vdW}^{att} : \frac{C}{r^6} + O(r^{-8})$$

○ Only attraction present between nonpolar molecules

- *reason that Ar, He, CH<sub>4</sub>, etc. form liquid phases*

○ a.k.a. “London” or “dispersion” forces

# Van der Waals Repulsion

- Overlap of electron clouds 
- Theory provides little guidance on form of model
- Two popular treatments

*inverse power*

typically  $n \sim 9 - 12$

$$U_{vdW}^{rep} : \frac{A}{r^n}$$

*exponential*

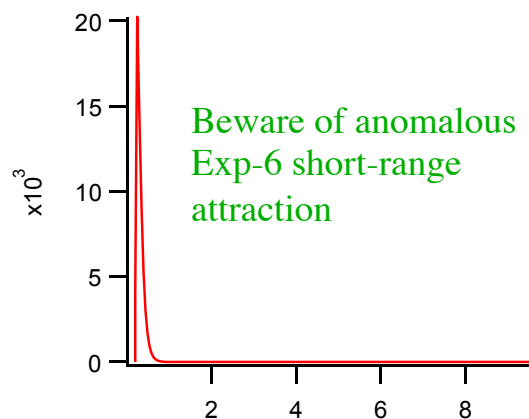
two parameters

$$U_{vdW}^{rep} : Ae^{-Br}$$

- Combine with attraction term

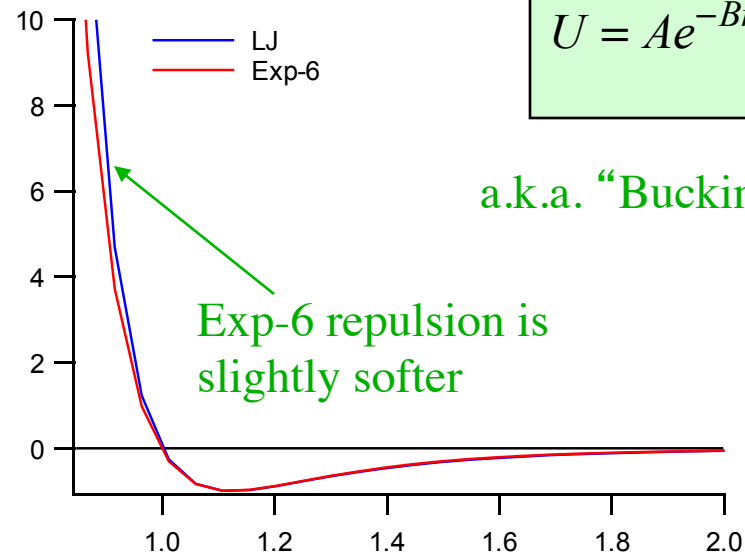
- *Lennard-Jones model*

$$U = \frac{A}{r^{12}} - \frac{C}{r^6}$$



- *Exp-6*

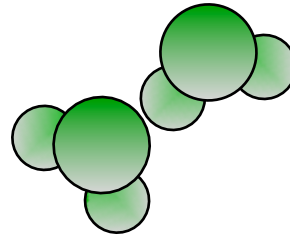
$$U = Ae^{-Br} - \frac{C}{r^6}$$



a.k.a. "Buckingham" or "Hill"

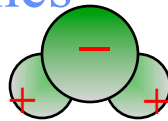
# Electrostatics 1.

○ Interaction between charge inhomogeneities

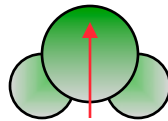


○ Modeling approaches

- *point charges*
- *point multipoles*



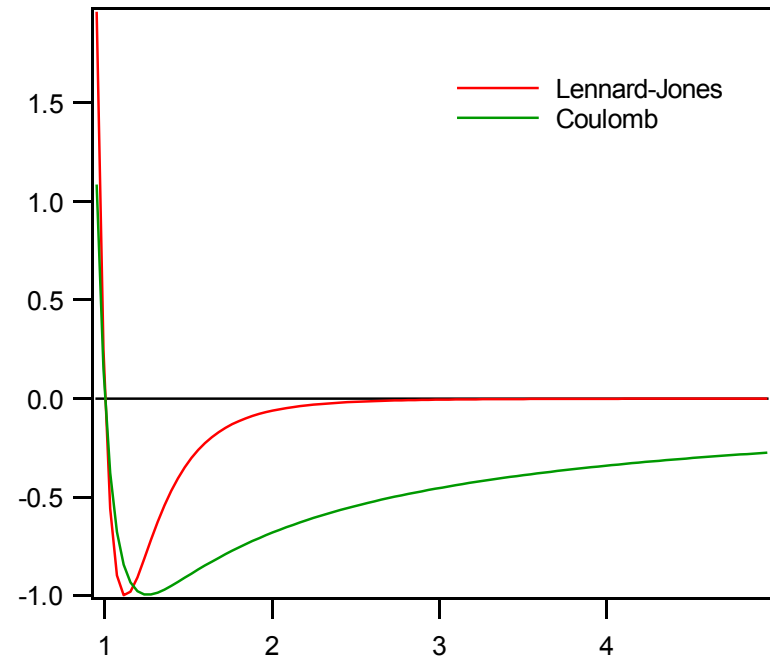
○ Point charges



- *assign Coulombic charges to several points in the molecule*
- *total charge sums to charge on molecule (usually zero)*
- *Coulomb potential*

$$U(r) = \frac{q_i q_j}{4\pi\epsilon_0 r}$$

very long ranged


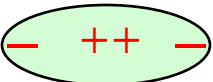




## Electrostatics 2.

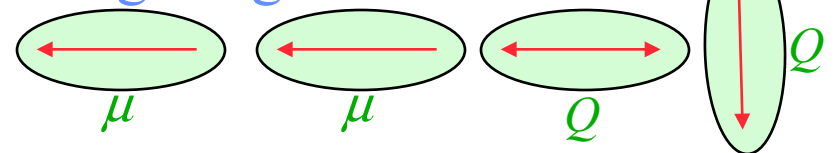
- At larger separations, details of charge distribution are less important

- Multipole statistics capture basic features

- *Dipole*  $\vec{\mu} = \sum_i q_i \mathbf{r}_i$  Vector   $\mu \neq 0, Q = 0$
- *Quadrupole*  $\mathbf{Q} = \sum_i q_i \mathbf{r}_i \mathbf{r}_i$  Tensor   $\mu = 0, Q \neq 0$
- *Octopole, etc.*

- Point multipole models based on long-range behavior

- *dipole-dipole*



$$u_{dd} = -\frac{\mu_1 \mu_2}{r^3} [3(\hat{\mu}_1 \cdot \hat{\mathbf{r}})(\hat{\mu}_2 \cdot \hat{\mathbf{r}}) - (\hat{\mu}_1 \cdot \hat{\mu}_2)]$$

- *dipole-quadrupole*

$$u_{dQ} = \frac{3}{2} \frac{\mu_1 Q_2}{r^4} [(\hat{\mu}_1 \cdot \hat{\mathbf{r}})(5(\hat{Q}_2 \cdot \hat{\mathbf{r}})^2 - 1) - 2(\hat{\mu}_1 \cdot \hat{\mu}_2)(\hat{Q}_2 \cdot \hat{\mathbf{r}})]$$

- *quadrupole-quadrupole*

$$u_{QQ} = \frac{3}{4} \frac{Q_1 Q_2}{r^5} [1 - 5c_1^2 - 5c_2^2 + 2c_{12}^2 + 35c_1^2 c_2^2 - 20c_1 c_2 c_{12}]$$

Axially  
symmetric  
quadrupole

# Electrostatics 3.

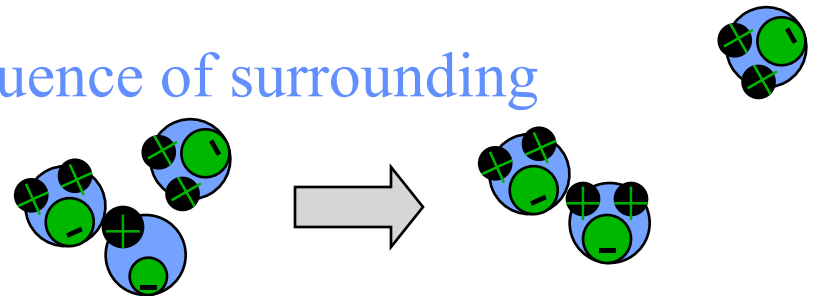
## Some Experimental/Theoretical Values

Molecule	$\mu$ , Debye	Q, B	$\alpha$ , $\text{\AA}^3$
He	0	0	0.206
Ar	0	0	1.642
O <sub>2</sub>	0	-0.4	1.48
N <sub>2</sub>	0	→ -1.4	1.7
Cl <sub>2</sub>	0	4.2	4.6
HF	→ 1.8	2.6	→ 0.8
CO <sub>2</sub>	0	→ -4.3	2.9
H <sub>2</sub> O	→ 1.85	+1.97 (xx) -1.89 (yy) -0.08 (zz)	1.5 (xx) 1.43 (yy) 1.45 (zz)
CH <sub>4</sub>	0	0	2.6
CCl <sub>4</sub>	0	0	→ 11.2
C <sub>6</sub> H <sub>6</sub>	0	→ -9.5	→ 10.6
NH <sub>3</sub>	1.5	-2.3	2.22
C <sub>2</sub> H <sub>6</sub>	0	-1.2	4.4

# Polarization

- Charge redistribution due to influence of surrounding molecules

- *dipole moment in bulk different from that in vacuum*



- Modeled with polarizable charges or multipoles

- Involves an iterative calculation

- *evaluate electric field acting on each charge due to other charges*
- *adjust charges according to polarizability and electric field*
- *re-compute electric field and repeat to convergence*

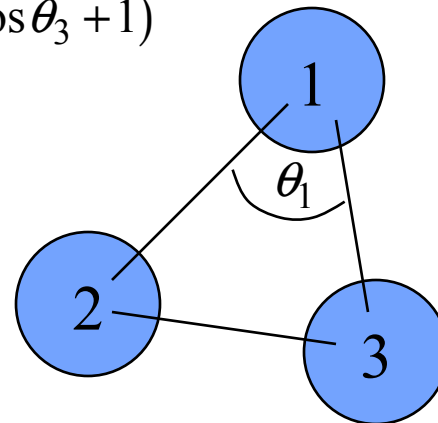
- Re-iteration over all molecules required if even one is moved

# Explicit Multibody Interactions

## ○ Axilrod-Teller $u^{(3)}$

- *consider response of atoms 2 and 3 to fluctuation in dipole moment of atom 1*
- *average over all fluctuations in 1*

$$u(\mathbf{r}_1, \mathbf{r}_2, \mathbf{r}_3) = \frac{3}{2} \frac{E\alpha_1\alpha_2\alpha_3}{r_{12}^3 r_{23}^3 r_{13}^3} (3\cos\theta_1 \cos\theta_2 \cos\theta_3 + 1)$$



# Unlike-Atom Interactions

- “Mixing rules” give the potential parameters for interactions of atoms that are not the same type

- *no ambiguity for Coulomb interaction*  $U(r) = \frac{q_i q_j}{4\pi\epsilon_0 r}$
- *for effective potentials (e.g., LJ) it is not clear what to do*

- Lorentz-Berthelot is a widely used choice

$$\sigma_{12} = \frac{1}{2}(\sigma_1 + \sigma_2)$$

$$\epsilon_{12} = \sqrt{\epsilon_1 \epsilon_2}$$

- Treatment is a very weak link in quantitative applications of molecular simulation

# Common Approximations in Molecular Models

## ○ Rigid intramolecular degrees of freedom

- *fast intramolecular motions slow down MD calculations*

## ○ Ignore hydrogen atoms

- *united atom representation*

## ○ Ignore polarization

- *expensive  $n$ -body effect*

## ○ Ignore electrostatics

## ○ Treat whole molecule as one big atom

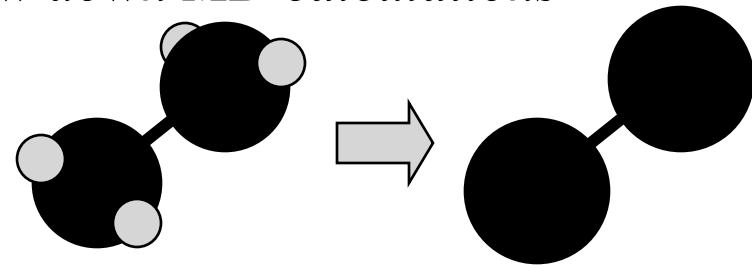
- *maybe anisotropic*

## ○ Model vdW forces via discontinuous potentials

## ○ Ignore all attraction

## ○ Model space as a lattice

- *especially useful for polymer molecules*



*Qualitative models*

# Summary

- Intermolecular forces arise from quantum mechanics
  - *too complex to include in lengthy simulations of bulk phases*
- Empirical forms give simple formulas to approximate behavior
  - *intramolecular forms: bend, stretch, torsion*
  - *intermolecular: van der Waals, electrostatics, polarization*
- Unlike-atom interactions weak link in quantitative work