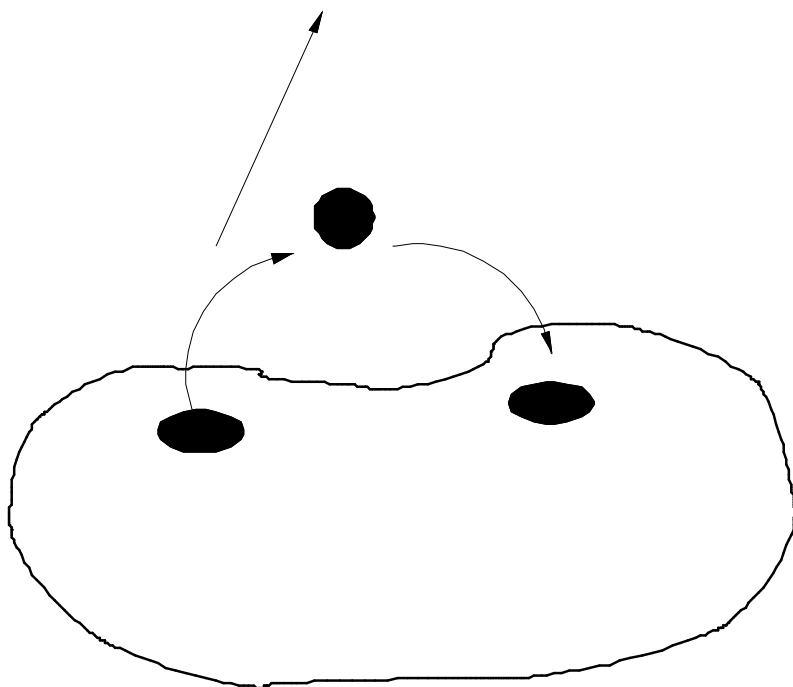


# Browndye: Software for Brownian Dynamics

Second-order rate association rate constants

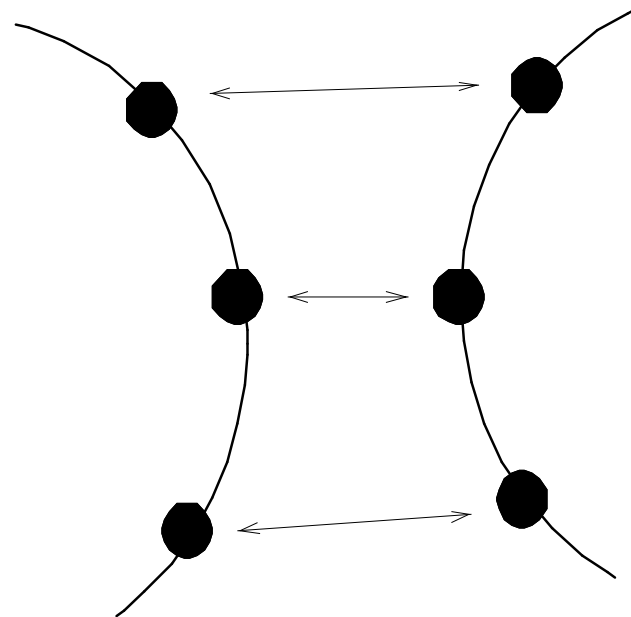
Site-to-site transfer probabilities



Trajectories for visualization

# Inputs

- Atom positions and charges, both molecules  
Crystal structure  
PDB2PQR
- Electric Field  
APBS  
Can have nested grids
- Reaction Criteria  
Atom-atom distances

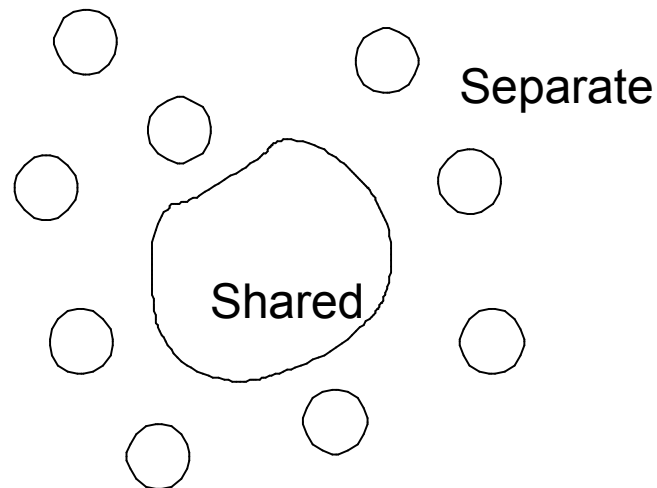


# Software Structure

About 35 preprocessing programs  
Written mostly in Ocaml

Two simulation programs  
Written in C++11  
Multithreaded

Run many simulations at once while sharing the same data

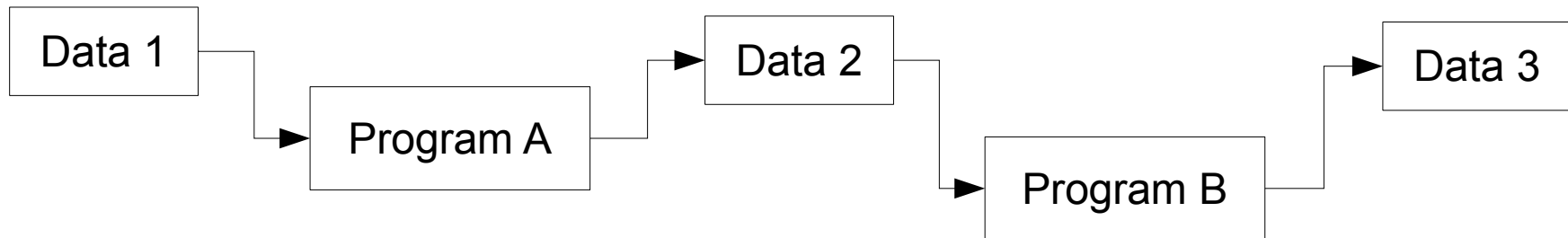


# Software Structure (cont.)

- Orchestrator Program (bd\_top)

Makes sure that preprocessing programs are called in proper order on input and intermediate files

If a file changes, reruns programs that depend on it



If a change is made to Data 2, only Program B is rerun

# XML Files

```
<roottag>
  <residue>
    <atom>
      <x>1.0</x>
      <y>2.0</y>
      <z>3.0</z>
      <radius>4.0</radius>
      <charge>1.0</charge>
    </atom>
    ....
  </residue>
  ....
</roottag>
```

- Easy to read and edit
- Easy to generate
- Easy to parse, lots of free software for doing so
- Can add additional stuff without breaking software

# Software Structure (cont)

- Runs on Linux and Mac
  - can use Cygwin on Windows
  - Docker containers
- Key algorithms are coded in a generic manner
  - C++ templates
  - User can use own data structures
  - User just has to write a little glue code in order to use in own software package

# Brownian Dynamics

- Assume rigid bodies with some flexible loops and linkers
- Can be derived from Newton's Laws of Motion
- Assumption: time scale of solute motions  $\gg$  time scale of solvent molecule motions

$$d \vec{x} = \frac{1}{k_B T} \mathbf{D} \cdot \vec{F} dt + \sqrt{2 dt} \mathbf{S} \cdot \vec{w}$$

$\vec{w}$  - Vector of random, Gaussian numbers (mean 0, sdev 1)

Valid only if F does not vary much during a time step

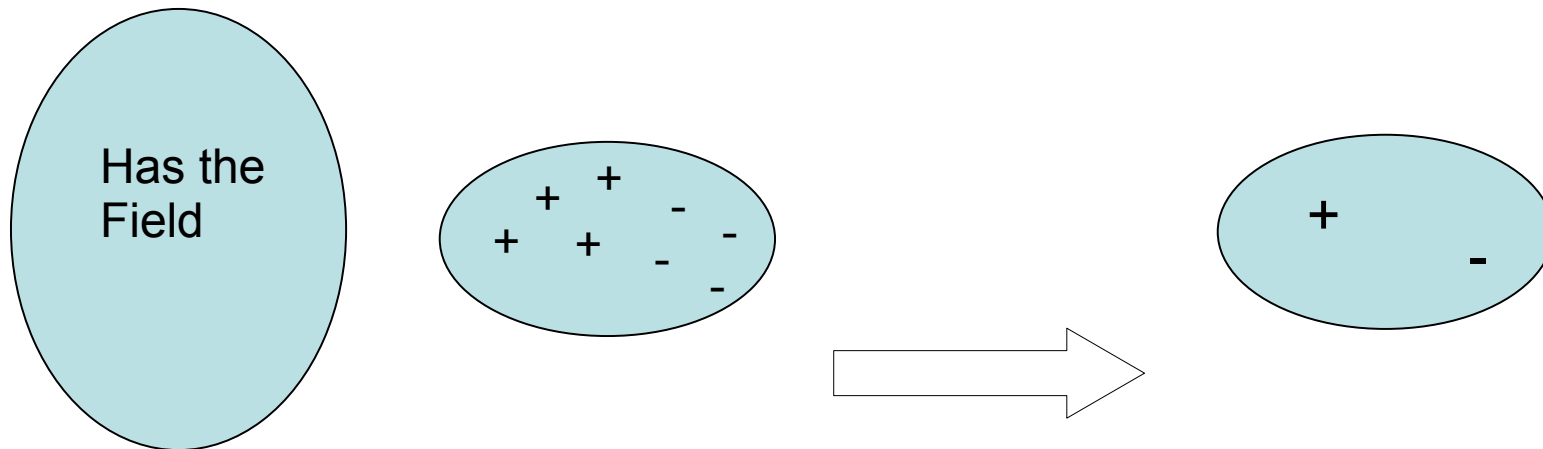
# Force Calculations

- Electrostatic (Coulomb's Law)
- Short Ranged
- Desolvation
- Hydrodynamic
- Flexible (MM style)



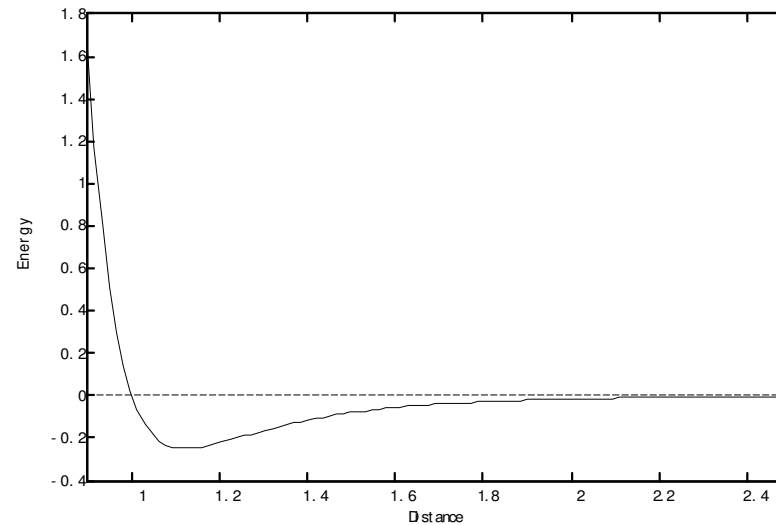
# Electrostatic Forces

- Charges of one molecule feel electric field of other molecule
- Lump charges together to save time

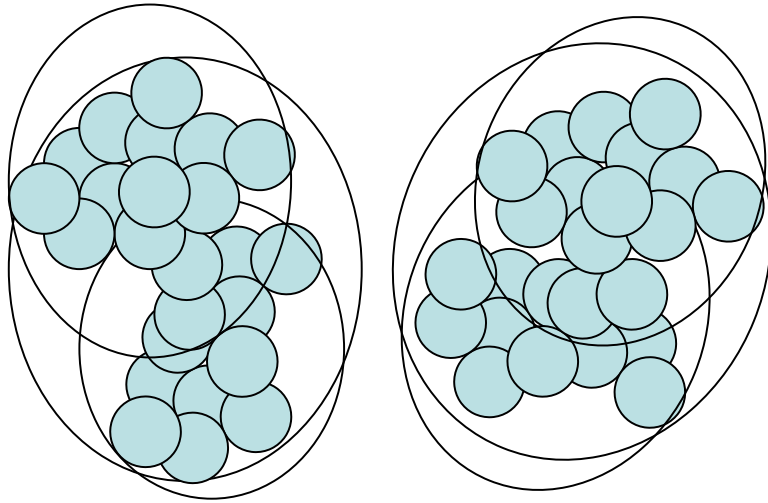


# Short-Ranged Forces

- Dispersion (Lennard-Jones)
  - Attract when farther out
  - Strongly repel when too close



# Proximity Detection for Short Ranged Forces



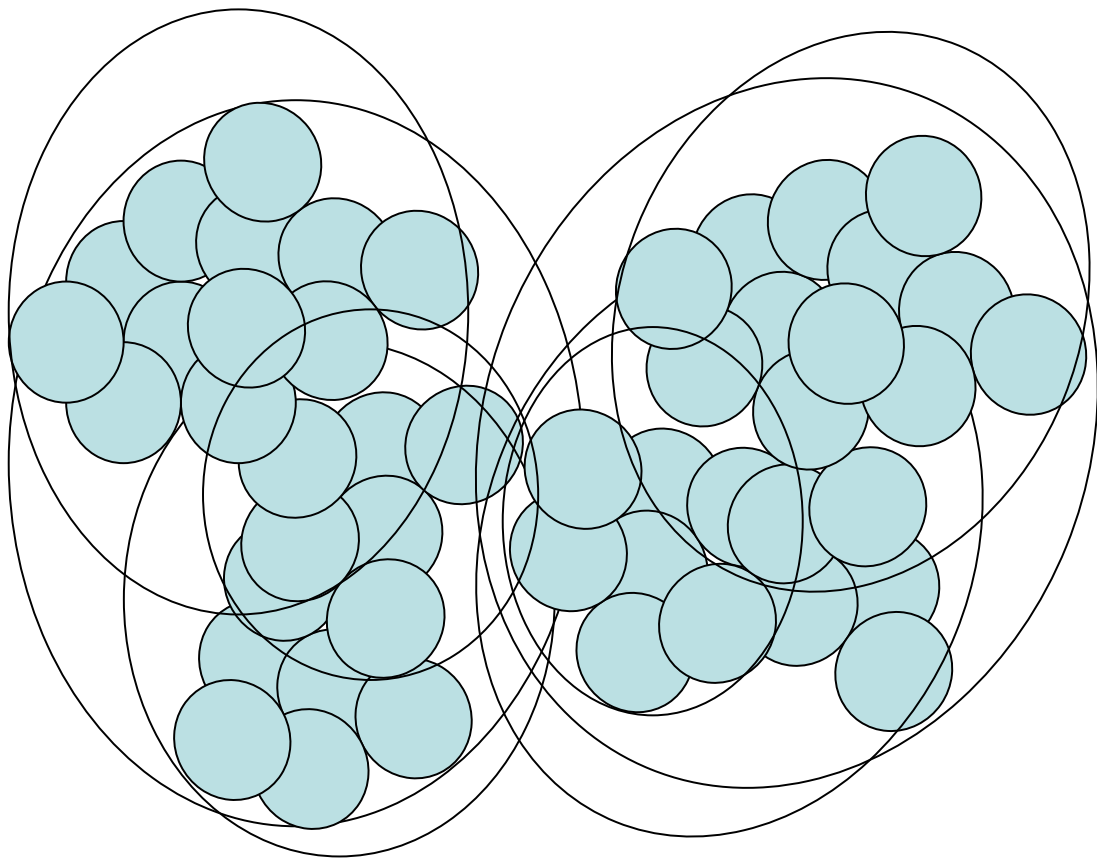
Done ahead of time:

- Find smallest enclosing sphere for molecule
- Divide molecule in half, and find enclosing spheres for each half
- Repeat previous steps for halves and their children
- Stop when just a few atoms in each sphere

Proximity test:

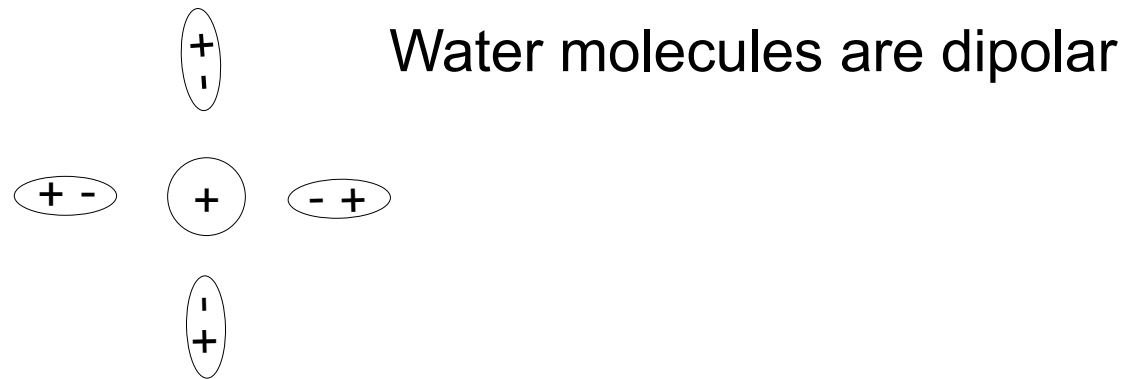
- Test distance between two outer spheres
- If not near, then no collision
- If are near, then recursively test distances between children spheres
- Test individual atoms at lowest level

Additional trick: remove interior atoms beforehand



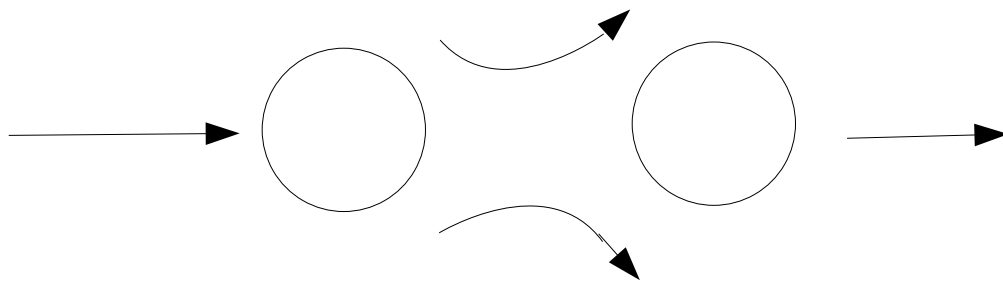
# Desolvation Forces

- Charges like to stay in solution
- Repulsive force between charge and surface



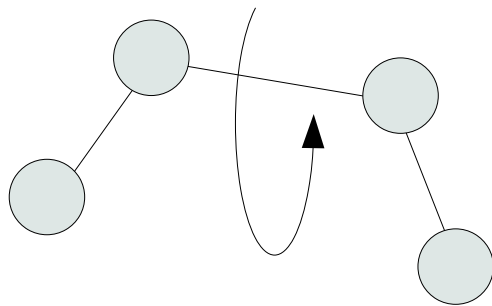
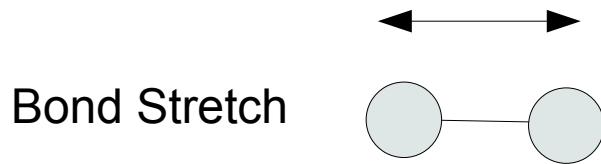
# Hydrodynamic Forces

- Movement of molecule causes motion of surrounding fluid
- Fluid pushes on neighboring molecule
- Not in  $F$  term in BD equation; rather, in  $D$

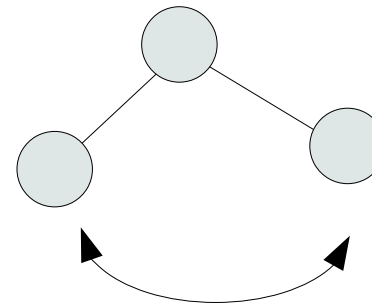


# Interactions for Flexible Parts

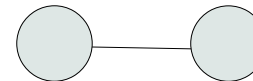
Similar to forces for Molecular Dynamics



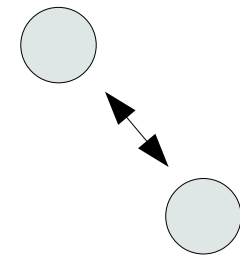
Torsion or Dihedral Angle



Bond Angle



Rigid Constraint



Short-ranged



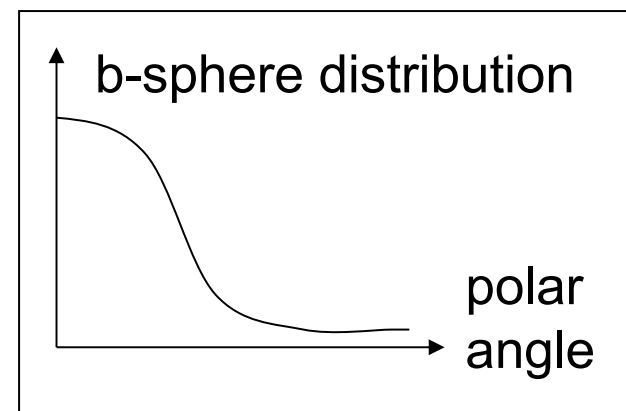
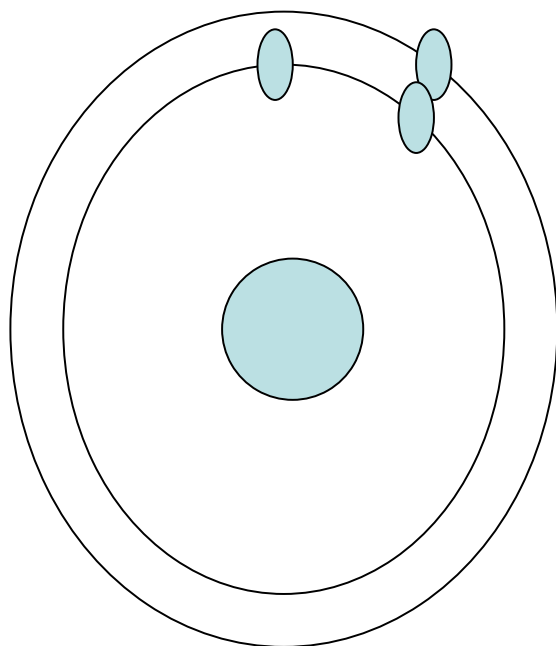
Charges

# Rate Constant Calculation

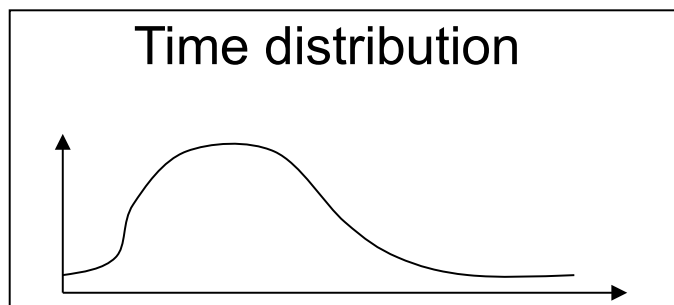
- Surround larger molecule with two spheres
- Must be large enough so forces are spherically symmetric
- Builds on work by Luty, McCammon, and Zhou



# Rate Constant Calculation (cont.)



- Start ligand on inner b-sphere
- If it reaches outer sphere before reacting, then:
  - Compute probability of ever returning to b-sphere
  - Roll the dice: if it returns, place back onto b-sphere according to precomputed probability distribution
- Figure out how much time was spent in transit by drawing a time from a time distribution
- Update the rotational states using transit time



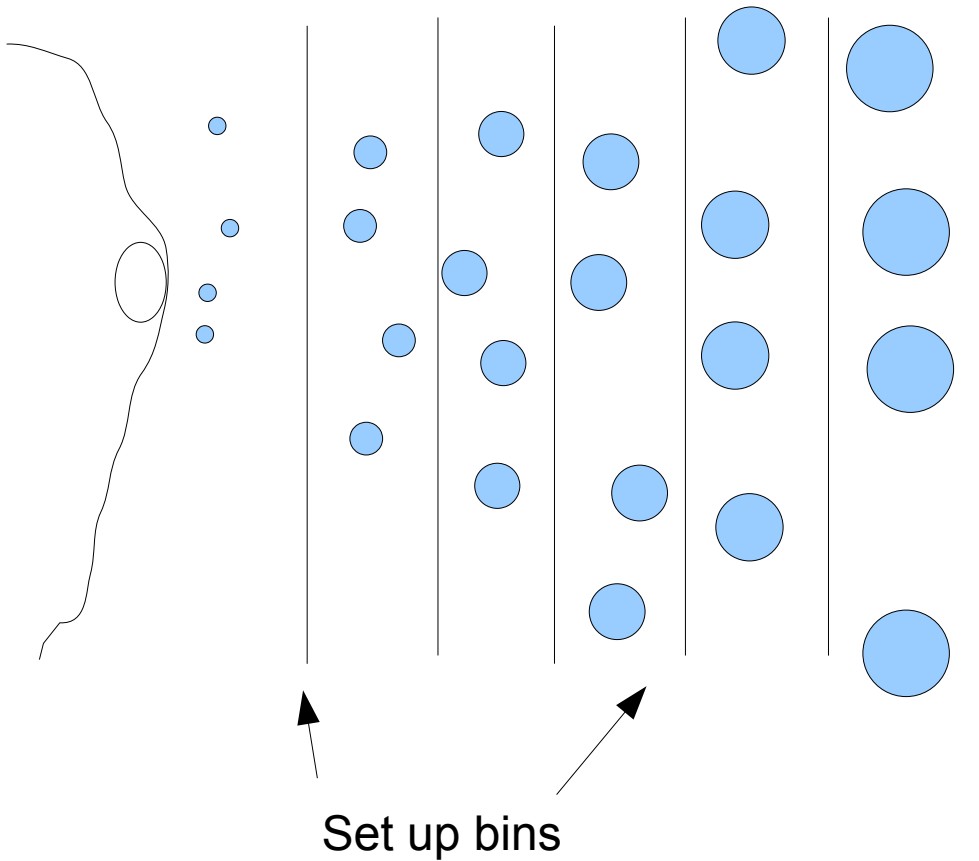
## Rate Constant Calculation (cont.)

- One trajectory
  - Start on b-sphere
  - Keep going until reaction or escape
- Run many trajectories
  - Probability of reaction vs. escape is used to compute rate constant
  - Need to run enough trajectories to get good statistics and good estimate on rate constant
- Site-site probability – start on first site, run until escape or reaching of second site

# Infrequent Reactions

- Must run very large number of trajectories
- Instead, run many copies at once and use statistical weighting to get better sampling in less time
- Weighted Ensemble Method

# Weighted Ensemble Method



Run many copies

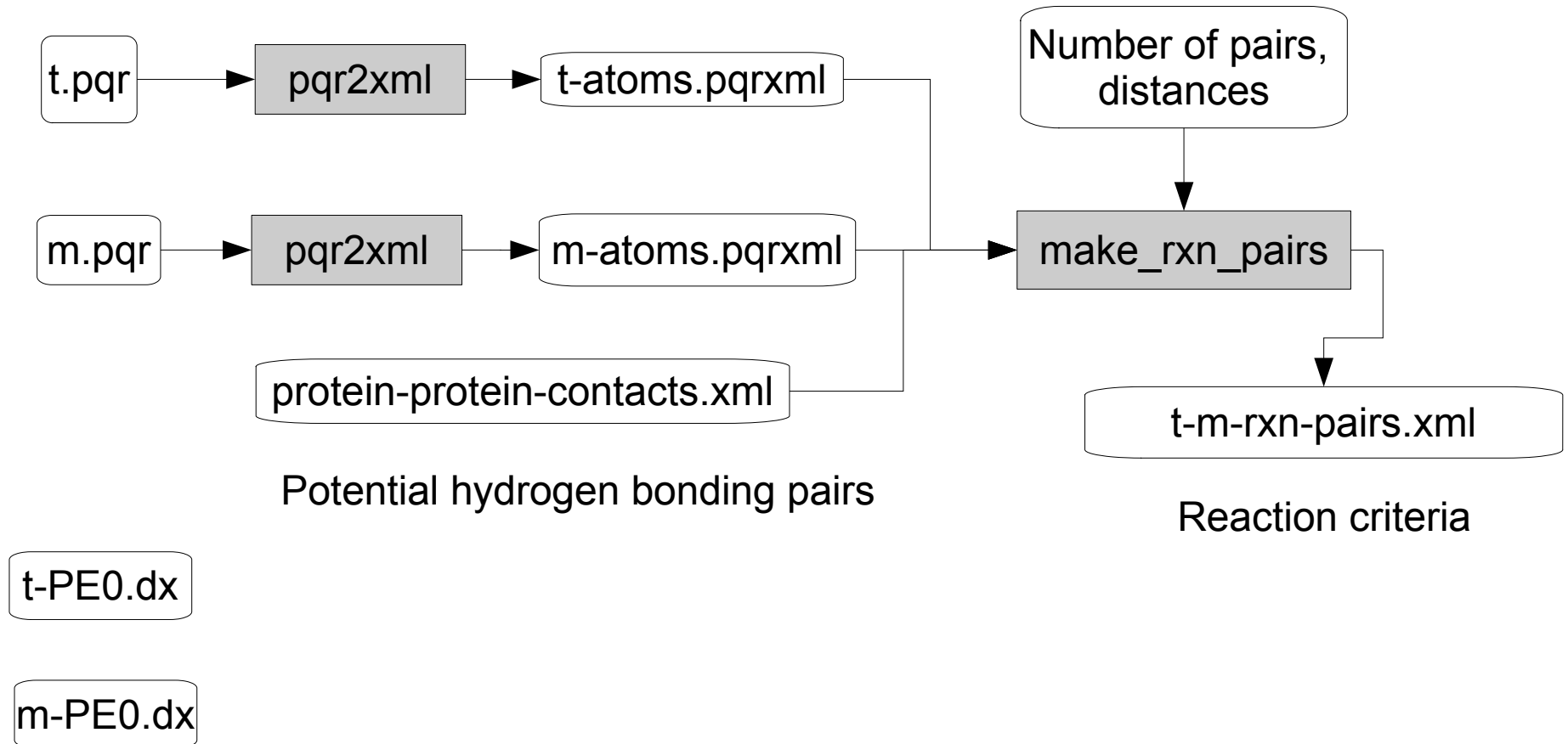
Split and combine copies to keep equal numbers in each bin

Size shown is statistical weight; does not affect physics

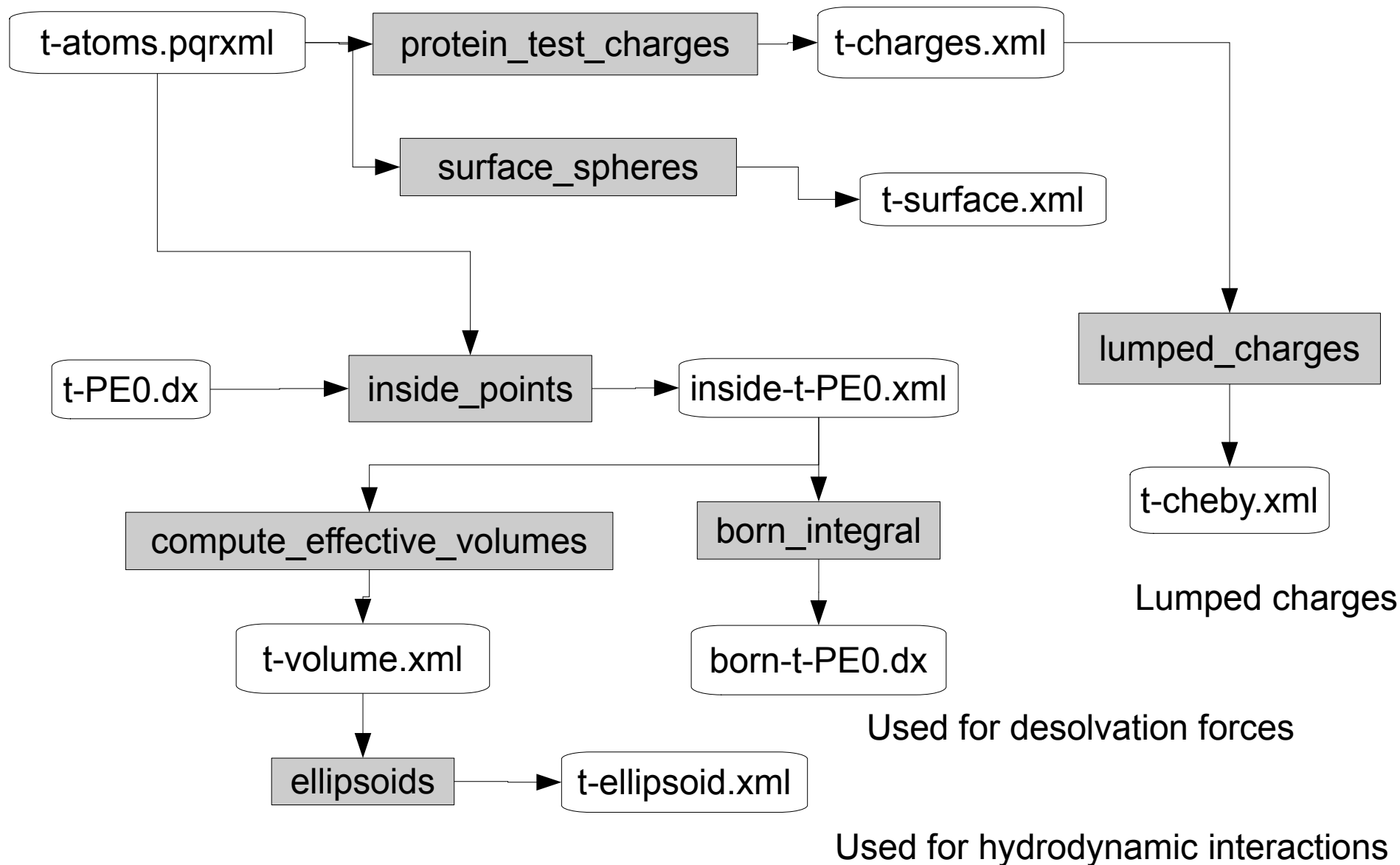
Can always measure something even for very rare events

# Program Flow

t – thrombin; m - thrombomodulin



# Program Flow (cont.)



# Simulation Programs

- nam\_simulation (Northrup-Allison-McCammon)
  - Computes one trajectory at a time
- we\_simulation
  - Uses weighted ensemble method
- Overall scheme
  - bd\_top runs the preprocessing programs
  - In addition to the various files, an overall simulation file is generated (thrombin\_modulin\_simulation.xml in example)
  - User then runs simulation programs

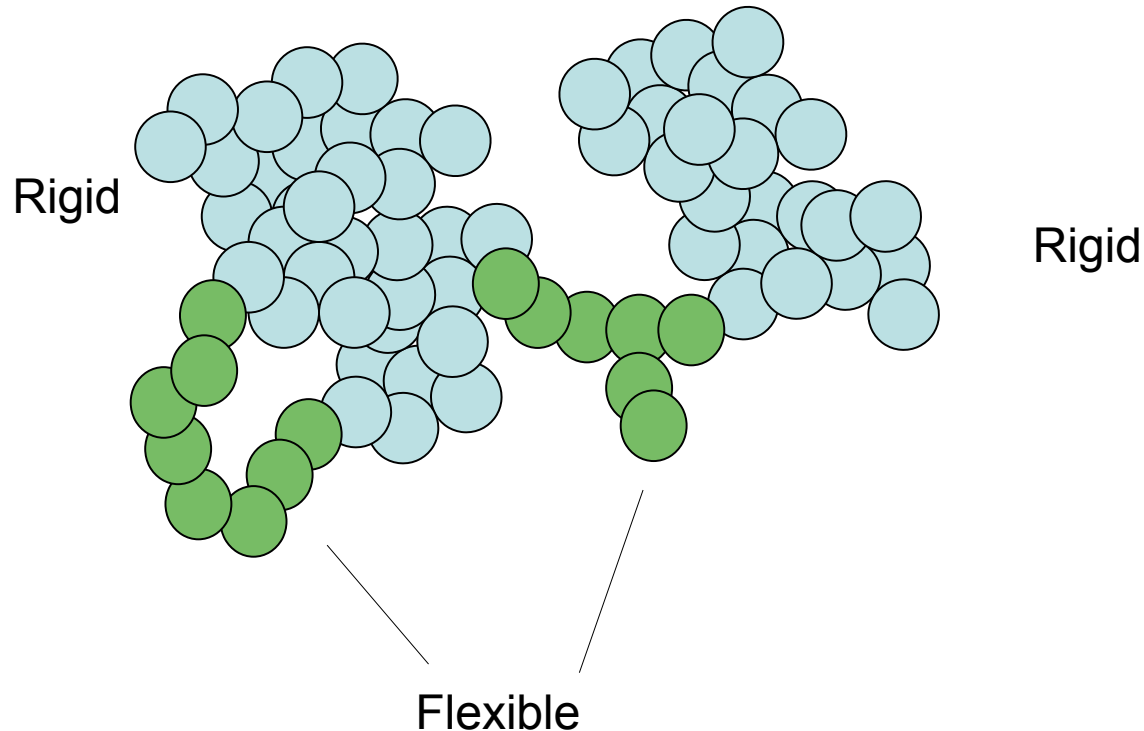
# Limitations

- Simplified model
- Need to know structure of complex
- Rates are sensitive to reaction criteria distances
  - Big fat adjustable parameter!
  - Okay to tune distances to match rates at one set of conditions, and use for different set (ionic strength, pH, mutations)



# Browndye 2.0

- Allows flexible chains and loops in addition to rigid cores
- Allows more than two bodies
- Still untried on complex systems



# Conclusion

- [browndye.ucsd.edu](http://browndye.ucsd.edu) – code and documentation
- Computer Physics Communications 181 (11), 1896-1905 (2010)
- Thanks to Andy McCammon, Robert Konecny, and others
- Howard Hughes Medical Institute, NIH

# Ongoing Research

Ability to compute off-rates and thence binding equilibria

Combination with Molecular Dynamics  
(SEEKR in Amaro lab)

Flexible cores

Box full of many molecules