# OPENMD: Molecular Dynamics in the Open

Shenyu Kuang, Chunlei Li, Charles F. Vardeman II,
Teng Lin, Christopher J. Fennell, Xiuquan Sun,
Kyle Daily, Yang Zheng, Matthew A. Meineke, and J. Daniel Gezelter
Department of Chemistry and Biochemistry
University of Notre Dame
Notre Dame, Indiana 46556

October 13, 2009

## **Preface**

OPENMD is an open source molecular dynamics engine which is capable of efficiently simulating liquids, proteins, nanoparticles, interfaces, and other complex systems using atom types with orientational degrees of freedom (e.g. "sticky" atoms, point dipoles, and coarse-grained assemblies). Proteins, zeolites, lipids, transition metals (bulk, flat interfaces, and nanoparticles) have all been simulated using force fields included with the code. OPENMD works on parallel computers using the Message Passing Interface (MPI), and comes with a number of analysis and utility programs that are easy to use and modify. An OpenMD simulation is specified using a very simple meta-data language that is easy to learn.

# **Contents**

1	Intr	oduction	1				
2	Con	Concepts & Files					
	2.1	OpenMD Files and <metadata> blocks</metadata>	4				
	2.2	Atoms, Molecules, and other ways of grouping atoms	6				
	2.3	Creating a <metadata> block</metadata>	8				
	2.4	<pre><snapshot> Blocks</snapshot></pre>	12				
	2.5	Generation of Initial Coordinates	13				
	2.6	The Statistics File	14				
3	The	Empirical Energy Functions	17				
	3.1	The Lennard Jones Force Field	18				
	3.2	Dipolar Unified-Atom Force Field	19				
		3.2.1 DUFF Energy Functions	20				
		3.2.2 The DUFF Water Models: SSD/E and SSD/RF	21				
	3.3	The WATER Force Field	23				
	3.4	Embedded Atom Method	23				
	3.5	The Sutton-Chen Force Field	24				
	3.6	The CLAY force field	25				
	3.7	Electrostatics	25				
	3.8	Periodic Boundary Conditions	27				
4	Med	Mechanics 29					
	4.1	Integrating the Equations of Motion: the DLM method	29				
	4.2	Extended Systems for other Ensembles	32				
	4.3	Nosé-Hoover Thermostatting	35				
	4.4	Constant-pressure integration with isotropic box deformations (NPTi)	37				
	4.5	Constant-pressure integration with a flexible box (NPTf)	39				
	4.6	Constant pressure in 3 axes (NPTxyz)					
	4.7	Langevin Dynamics (LD)	40				
	4.8	Constraint Methods	43				
		4.8.1 The RATTLE Method for Bond Constraints	43				
		4.8.2 The Z-Constraint Method	43				
5	Res	traints	47				

6 Thermodynamic Integration						
7	Ener	rgy Min	nimization	53		
8	Analysis of Physical Properties					
	8.1	Conce	pts	55		
	8.2	Syntax	c of the Select Command	56		
		8.2.1	Logical expressions	56		
		8.2.2	Name expressions	57		
		8.2.3	Index expressions	57		
		8.2.4	Predefined sets	57		
		8.2.5	User-defined expressions	57		
		8.2.6	Comparison expressions	57		
		8.2.7	Within expressions	58		
	8.3	Tools v	which use the selection command	58		
		8.3.1	Dump2XYZ	58		
		8.3.2	StaticProps	59		
		8.3.3	DynamicProps	61		
9	Preparing Input Configurations					
	9.1	atom2i	md, xyz2md, and pdb2md	63		
	9.2	Simple	eBuilder	64		
	9.3	Hydro		64		
10	Par	allel Sir	mulation Implementation	67		
11	Con	clusion		69		
12	Acknowledgments 71					

# **Chapter 1**

# Introduction

There are a number of excellent molecular dynamics packages available to the chemical physics community. [1, 2, 3, 4, 5, 6, 7, 8, 9, 10] All of these packages are stable, polished programs which solve many problems of interest. Most are now capable of performing molecular dynamics simulations on parallel computers. Some have source code which is freely available to the entire scientific community. Few, however, are capable of efficiently integrating the equations of motion for atom types with orientational degrees of freedom (e.g. point dipoles, and "sticky" atoms). And only one of the programs referenced can handle transition metal force fields like the Embedded Atom Method (EAM). The direction our research program has taken us now involves the use of atoms with orientational degrees of freedom as well as transition metals. Since these simulation methods may be of some use to other researchers, we have decided to release our program (and all related source code) to the scientific community.

This document communicates the algorithmic details of our program, OPENMD. We have structured this document to first discuss the underlying concepts in this simulation package (Sec. 2). The empirical energy functions implemented are discussed in Sec. 3. Sec. 4 describes the various Molecular Dynamics algorithms OPENMD implements in the integration of Hamilton's equations of motion. Program design considerations for parallel computing are presented in Sec. 10. Concluding remarks are presented in Sec. 11.

# Chapter 2

# **Concepts & Files**

A simulation in OPENMD is built using a few fundamental conceptual building blocks most of which are chemically intuitive. The basic unit of a simulation is an atom. The parameters describing an atom have been generalized to make it as flexible as possible; this means that in addition to translational degrees of freedom, Atoms may also have *orientational* degrees of freedom.

The fundamental (static) properties of atoms are defined by the forceField chosen for the simulation. The atomic properties specified by a forceField might include (but are not limited to) charge,  $\sigma$  and  $\epsilon$  values for Lennard-Jones interactions, the strength of the dipole moment ( $\mu$ ), the mass, and the moments of inertia. Other more complicated properties of atoms might also be specified by the forceField.

Atoms can be grouped together in many ways. A rigidBody contains atoms that exert no forces on one another and which move as a single rigid unit. A cutoffGroup may contain atoms which function together as a (rigid *or* non-rigid) unit for potential energy calculations,

$$V_{ab} = s(r_{ab}) \sum_{i \in a} \sum_{j \in b} V_{ij}(r_{ij})$$
(2.1)

Here, a and b are two cutoffGroups containing multiple atoms ( $a = \{i\}$  and  $b = \{j\}$ ).  $s(r_{ab})$  is a generalized switching function which insures that the atoms in the two cutoffGroups are treated identically as the two groups enter or leave an interaction region.

Atoms may also be grouped in more traditional ways into bonds, bends, and torsions. These groupings allow the correct choice of interaction parameters for short-range interactions to be chosen from the definitions in the forceField.

All of these groups of atoms are brought together in the molecule, which is the fundamental structure for setting up and OPENMD simulation. Molecules contain lists of atoms followed by listings of the other atomic groupings (bonds, bends, torsions, rigidBodies, and cutoffGroups) which relate the atoms to one another. Since a rigidBody is a collection of atoms that are propagated in fixed relationships to one another, OPENMD uses an internal structure called a StuntDouble to store information about those objects that can change position *independently* during a simulation. That is, an atom that is part of a rigid body is not itself a StuntDouble. In this case, the rigid body is the StuntDouble. However, an atom that is free to move independently *is* its own StuntDouble.

Simulations often involve heterogeneous collections of molecules. To specify a mixture of molecule types, OPENMD uses components. Even simulations containing only one type of molecule must specify a single component.

Starting a simulation requires two types of information: *meta-data*, which describes the types of objects present in

```
<OpenMD>
  <MetaData>
      // see section 2.3 for details on the formatting
      // of information contained inside the <MetaData> tags
  </MetaData>
  <Snapshot>
                     // An instantaneous configuration
     <FrameData>
                     // FrameData contains information on the time
                     // stamp, the size of the simulation box, and
                     // the current state of extended system
                     // ensemble variables.
     </FrameData>
     <StuntDoubles>
                     // StuntDouble information comprises the
                     // positions, velocities, orientations, and
                     // angular velocities of anything that is
                     // capable of independent motion during
                     // the simulation.
     </StuntDoubles>
  </Snapshot>
                     // Multiple <Snapshot> sections can be
  <Snapshot>
  </Snapshot>
                     // present in a well-formed OpenMD file
  <Snapshot>
                     // Further information on <Snapshot> blocks
                     // can be found in section 2.4.
  </Snapshot>
</OpenMD>
```

Scheme 2.1: The basic structure of an OPENMD file contains HTML-like tags to define simulation meta-data and subsequent instantaneous configuration information. A well-formed OPENMD file must contain one <MetaData> block and *at least one* <Snapshot> block. Each <Snapshot> is further divided into <FrameData> and <StuntDoubles> sections.

the simulation, and *configuration* information, which describes the initial state of these objects. An OPENMD file is a single combined file format that describes both of these kinds of data. An OPENMD file contains one <MetaData> block and *at least one* <Snapshot> block.

The language for the <MetaData> block is a C-based syntax that is parsed at the beginning of the simulation. Configuration information is specified for all integrableObjects in a <Snapshot> block. Both the <MetaData> and <Snapshot> formats are described in the following sections.

## 2.1 OpenMD Files and <MetaData> blocks

OPENMD uses a HTML-like syntax to separate <MetaData> and <Snapshot> blocks. A C-based syntax is used to parse the <MetaData> blocks at run time. These blocks allow the user to completely describe the system they wish to simulate, as well as tailor OPENMD's behavior during the simulation. OPENMD files are typically denoted with the extension .md (which can stand for Meta-Data or Molecular Dynamics or Molecule Definition depending on the user's mood). An overview of an OPENMD file is shown in Scheme 2.1 and example file is shown in Scheme 2.2.

Within the <MetaData> block it is necessary to provide a complete description of the molecule before it is actually placed in the simulation. OPENMD's meta-data syntax was originally developed with this goal in mind,

```
<OpenMD>
  <MetaData>
molecule{
 name = "Ar";
  atom[0]{
   type="Ar";
   position( 0.0, 0.0, 0.0 );
  }
}
component {
 type = "Ar";
 nMol = 3;
}
forceField = "LJ";
ensemble = "NVE"; // specify the simulation ensemble
                  // the time step for integration
dt = 1.0;
                 // the total simulation run time
runTime = 1e3;
sampleTime = 100; // trajectory file frequency
statusTime = 50; // statistics file frequency
  </MetaData>
  <Snapshot>
    <FrameData>
        Time: 0
        Hmat: {{ 28.569, 0, 0}, { 0, 28.569, 0}, { 0, 0, 28.569}}
  Thermostat: 0 , 0
    Barostat: {{ 0, 0, 0 }, { 0, 0, 0 }, { 0, 0, 0 }}
    </FrameData>
    <StuntDoubles>
         0
                    17.5 13.3 12.8 1.181e-03 -1.630e-03 -1.369e-03
                pv -12.8 -14.9 -8.4 -4.440e-04 -2.048e-03 1.130e-03
                pv -10.0 -15.2 -6.5 2.239e-03 -6.310e-03 1.810e-03
    </StuntDoubles>
  </Snapshot>
</OpenMD>
```

Scheme 2.2: An example showing a complete OpenMD file.

```
molecule{
  name = "Ar";
  atom[0]{
    type="Ar";
    position( 0.0, 0.0, 0.0 );
  }
}
```

Scheme 2.3: An example molecule definition in an include file.

and allows for the use of *include files* to specify all atoms in a molecular prototype, as well as any bonds, bends, or torsions. Include files allow the user to describe a molecular prototype once, then simply include it into each simulation containing that molecule. Returning to the example in Scheme 2.2, the include file's contents would be Scheme 2.3, and the new OPENMD file would become Scheme 2.4.

## 2.2 Atoms, Molecules, and other ways of grouping atoms

As mentioned above, the fundamental unit for an OPENMD simulation is the atom. Atoms can be collected into secondary structures such as rigidBodies, cutoffGroups, or molecules. The molecule is a way for OPENMD to keep track of the atoms in a simulation in logical manner. Molecular units store the identities of all the atoms and rigid bodies associated with themselves, and they are responsible for the evaluation of their own internal interactions (*i.e.* bonds, bends, and torsions). Scheme 2.3 shows how one creates a molecule in an included meta-data file. The positions of the atoms given in the declaration are relative to the origin of the molecule, and the origin is used when creating a system containing the molecule.

One of the features that sets OPENMD apart from most of the current molecular simulation packages is the ability to handle rigid body dynamics. Rigid bodies are non-spherical particles or collections of particles (e.g.  $C_{60}$ ) that have a constant internal potential and move collectively.[11] They are not included in most simulation packages because of the algorithmic complexity involved in propagating orientational degrees of freedom. Integrators which propagate orientational motion with an acceptable level of energy conservation for molecular dynamics are relatively new inventions.

Moving a rigid body involves determination of both the force and torque applied by the surroundings, which directly affect the translational and rotational motion in turn. In order to accumulate the total force on a rigid body, the external forces and torques must first be calculated for all the internal particles. The total force on the rigid body is simply the sum of these external forces. Accumulation of the total torque on the rigid body is more complex than the force because the torque is applied to the center of mass of the rigid body. The space-fixed torque on rigid body i is

$$\boldsymbol{\tau}_i = \sum_{a} \left[ (\mathbf{r}_{ia} - \mathbf{r}_i) \times \mathbf{f}_{ia} + \boldsymbol{\tau}_{ia} \right], \tag{2.2}$$

where  $\tau_i$  and  $\mathbf{r}_i$  are the torque on and position of the center of mass respectively, while  $\mathbf{f}_{ia}$ ,  $\mathbf{r}_{ia}$ , and  $\tau_{ia}$  are the force on, position of, and torque on the component particles of the rigid body.

The summation of the total torque is done in the body fixed axis of each rigid body. In order to move between the space fixed and body fixed coordinate axes, parameters describing the orientation must be maintained for each rigid body. At a minimum, the rotation matrix (A) can be described by the three Euler angles  $(\phi, \theta, \text{ and } \psi)$ , where

```
<OpenMD>
  <MetaData>
#include "argon.md"
component {
 type = "Ar";
 nMol = 3;
forceField = "LJ";
ensemble = "NVE";
dt = 1.0;
runTime = 1e3;
sampleTime = 100;
statusTime = 50;
  </MetaData>
  </MetaData>
  <Snapshot>
    <FrameData>
       Time: 0
       Hmat: {{ 28.569, 0, 0}, { 0, 28.569, 0}, { 0, 0, 28.569}}
 Thermostat: 0 , 0
   Barostat: {{ 0, 0, 0 }, { 0, 0, 0 }, { 0, 0, 0 }}
    </FrameData>
    <StuntDoubles>
         0
                   17.5 13.3 12.8 1.181e-03 -1.630e-03 -1.369e-03
               pv
               pv -12.8 -14.9 -8.4 -4.440e-04 -2.048e-03 1.130e-03
               pv -10.0 -15.2 -6.5 2.239e-03 -6.310e-03 1.810e-03
    </StuntDoubles>
  </Snapshot>
</OpenMD>
```

Scheme 2.4: Revised OpenMD input file example.

```
molecule {
 name = "TIP3P";
  atom[0]{
    type = "O_TIP3P";
    position( 0.0, 0.0, -0.06556 );
  atom[1]
    type = "H_TIP3P";
    position( 0.0, 0.75695, 0.52032 );
  atom[2]{
    type = "H_TIP3P";
    position(0.0, -0.75695, 0.52032);
  rigidBody[0]{
    members(0, 1, 2);
  cutoffGroup{
    members(0, 1, 2);
  }
```

Scheme 2.5: A sample definition of a molecule containing a rigid body and a cutoff group

the elements of A are composed of trigonometric operations involving  $\phi$ ,  $\theta$ , and  $\psi$ .[11] In order to avoid numerical instabilities inherent in using the Euler angles, the four parameter "quaternion" scheme is often used. The elements of A can be expressed as arithmetic operations involving the four quaternions  $(q_w, q_x, q_y, \text{ and } q_z)$ .[12] Use of quaternions also leads to performance enhancements, particularly for very small systems.[13]

Rather than use one of the previously stated methods, OPENMD utilizes a relatively new scheme that propagates the entire nine parameter rotation matrix. Further discussion on this choice can be found in Sec. 4.1. An example definition of a rigid body can be seen in Scheme 2.5.

## 2.3 Creating a <MetaData> block

The actual creation of a <MetaData> block requires several key components. The first part of the file needs to be the declaration of all of the molecule prototypes used in the simulation. This is typically done through included prototype files. Only the molecules actually present in the simulation need to be declared; however, OPENMD allows for the declaration of more molecules than are needed. This gives the user the ability to build up a library of commonly used molecules into a single include file.

Once all prototypes are declared, the ordering of the rest of the block is less stringent. The molecular composition of the simulation is specified with component statements. Each different type of molecule present in the simulation is considered a separate component (an example is shown in Sch. 2.4). The component blocks tell OPENMD the number of molecules that will be in the simulation, and the order in which the components blocks are declared sets the ordering of the real atoms in the <Snapshot> block as well as in the output files. The remainder of the script then

sets the various simulation parameters for the system of interest.

The required set of parameters that must be present in all simulations is given in Table 2.1. Since the user can use OPENMD to perform energy minimizations as well as molecular dynamics simulations, one of the minimizer or ensemble keywords must be present. The ensemble keyword is responsible for selecting the integration method used for the calculation of the equations of motion. An in depth discussion of the various methods available in OPENMD can be found in Sec. 4. The minimizer keyword selects which minimization method to use, and more details on the choices of minimizer parameters can be found in Sec. 7. The forceField statement is important for the selection of which forces will be used in the course of the simulation. OPENMD supports several force fields, as outlined in Sec. 3. The force fields are interchangeable between simulations, with the only requirement being that all atoms needed by the simulation are defined within the selected force field.

For molecular dynamics simulations, the time step between force evaluations is set with the dt parameter, and runTime will set the time length of the simulation. Note, that runTime is an absolute time, meaning if the simulation is started at t = 10.0 ns with a runTime of 25.0 ns, the simulation will only run for an additional 15.0 ns.

For energy minimizations, it is not necessary to specify dt or runTime.

To set the initial positions and velocities of all the integrable objects in the simulation, OPENMD will use the last good <Snapshot> block that was found in the startup file that it was called with. If the useInitalTime flag is set to true, the time stamp from this snapshot will also set the initial time stamp for the simulation. Additional parameters are summarized in Table 2.2.

It is important to note the fundamental units in all files which are read and written by OPENMD. Energies are in kcal  $\mathrm{mol}^{-1}$ , distances are in Å, times are in fs, translational velocities are in Å fs<sup>-1</sup>, and masses are in amu. Orientational degrees of freedom are described using quaternions (unitless, but  $q_w^2 + q_x^2 + q_y^2 + q_z^2 = 1$ ), body-fixed angular momenta (amu Å<sup>2</sup> radians fs<sup>-1</sup>), and body-fixed moments of inertia (amu Å<sup>2</sup>).

Table 2.1: Meta-data Keywords: Required Parameters

units	use	remarks
string	Sets the force field.	Possible force fields are DUFF, WA-
		TER, LJ, EAM, SC, and CLAY.
	Defines the molecular	Every <metadata> block must</metadata>
	components of the system	have a component statement.
string	Chooses a minimizer	Possible minimizers are SD and CG.
		Either ensemble or minimizer
		must be specified.
string	Sets the ensemble.	Possible ensembles are NVE, NVT,
		NPTi, NPAT, NPTf, NPTxyz,
		and LD. Either ensemble or
		minimizer must be specified.
fs	Sets the time step.	Selection of dt should be small
		enough to sample the fastest mo-
		tion of the simulation. (dt is re-
		quired for molecular dynamics sim-
		ulations)
	string string string	Sets the force field.  Defines the molecular components of the system String Chooses a minimizer  Sets the ensemble.

Table 2.1: Meta-data Keywords: Required Parameters

keyword	units	use	remarks
runTime	fs	Sets the time at which the	This is an absolute time, and will
		simulation should end.	end the simulation when the cur-
			rent time meets or exceeds the
			runTime. (runTime is required
			for molecular dynamics simula-
			tions)

Table 2.2: Meta-data Keywords: Optional Parameters

keyword	units	use	remarks
forceFieldVariant	string	Sets the name of the variant	EAM has three variants: u3, u6, and
		of the force field.	VC.
forceFieldFileName	string	Overrides the default force	Each force field has a default file
		field file name	name, and this parameter can over-
			ride the default file name for the
			chosen force field.
usePeriodicBoundary	Conditions		
	logical	Turns periodic boundary	Default is true.
		conditions on/off.	
orthoBoxTolerance	double		decides how orthogonal the peri-
			odic box must be before we can use
	0		cheaper box calculations
cutoffRadius	Å	Manually sets the cutoff ra-	the default value is set by the
		dius	cutoffPolicy
cutoffPolicy	string	one of mix, max, or tradi-	the traditional cutoff policy is to set
		tional	the cutoff radius for all atoms in the
			system to the same value (governed
			by the largest atom). mix and max
skinThickness	Å	thickness of the skin for the	are pair-dependent cutoff methods. defaults to 1 Å
SKININICKNESS	A	Verlet neighbor lists	defaults to 1 A
switchingRadius	Å	Manually sets the inner ra-	Defaults to 85 % of the
Switchinghadias	11	dius for the switching func-	cutoffRadius.
		tion.	catorinaarus.
switchingFunctionType			
2	string	cubic or	Default is cubic.
	C	fifth_order_polynomial	
useInitialTime	logical	Sets whether the initial	Useful when recovering a simula-
		time is taken from the last	tion from a crashed processor. De-
		<snapshot> in the startup</snapshot>	fault is false.
		file.	
useInitialExtendedSystemState			

Table 2.2: Meta-data Keywords: Optional Parameters

keyword	units	use	remarks
	logical	keep the extended system variables?	Should the extended variables (the thermostat and barostat) be kept from the <pre><snapshot> block?</snapshot></pre>
sampleTime	fs	Sets the frequency at which the .dump file is written.	The default is equal to the runTime.
resetTime	fs	Sets the frequency at which the extended system vari- ables are reset to zero	The default is to never reset these variables.
statusTime	fs	Sets the frequency at which the .stat file is written.	The default is equal to the sampleTime.
finalConfig	string	Sets the name of the final output file.	Useful when stringing simulations together. Defaults to the root name of the initial meta-data file but with an .eor extension.
compressDumpFile	logical		should the .dump file be compressed on the fly?
statFileFormat	string	TURE, PRESSURE, VOLTRANSLATIONAL_KINETIC, LONG_RANGE_POTENTIAL, VANDERWAALS_POTENTIAL, BOND_POTENTIAL, IM VHARM, PRESSURE_TENPRESSURE_TENSOR_Z	CINETIC_ENERGY, TEMPERA- LUME, CONSERVED_QUANTITY, ROTATIONAL_KINETIC, SHORT_RANGE_POTENTIAL, L, ELECTROSTATIC_POTENTIAL, BEND_POTENTIAL, DIHE- PROPER_POTENTIAL, VRAW, ISOR_X, PRESSURE_TENSOR_Y,
printPressureTensor		sets whether OPENMD will print out the pressure tensor	can be useful for calculations of the bulk modulus
electrostaticSummat		1.0 1.0	
	string	shifted_force, shifted_potential, shifted_force, or reac- tion_field	default is shifted_force.
electrostaticScreen	ingMethod		
	string	undamped or damped	default is damped

Table 2.2: Meta-data Keywords: Optional Parameters

keyword	units	use	remarks
dielectric	unitless	Sets the dielectric constant	If electrostaticSummationMethod
		for reaction field.	is set to reaction_field, then
			dielectric must be set.
dampingAlpha	${\rm \AA}^{-1}$	governs strength of electro-	defaults to $0.2 \text{ Å}^{-1}$ .
		static damping	
tempSet	logical	resample velocities from	default is false.
		a Maxwell-Boltzmann	
		distribution set to	
		targetTemp	
thermalTime	fs	how often to perform a	default is never
		tempSet	
targetTemp	K	sets the target temperature	no default value
tauThermostat	fs	time constant for Nosé-	times from 1000-10,000 fs are rea-
		Hoover thermostat	sonable
targetPressure	atm	sets the target pressure	no default value
surfaceTension		sets the target surface ten-	no default value
		sion in the x-y plane	
tauBarostat	fs	time constant for the Nosé-	times from 10,000 to 100,000 fs are
		Hoover-Andersen barostat	reasonable
seed	integer	Sets the seed value for the	The seed needs to be at least 9 digits
		random number generator.	long. The default is to take the seed
			from the CPU clock.

## 2.4 <Snapshot> Blocks

The standard format for storage of a system's coordinates is the <Snapshot> block, the exact details of which can be seen in Scheme 2.6. As all bonding and molecular information is stored in the <MetaData> blocks, the <Snapshot> blocks contain only the coordinates of the objects which move independently during the simulation. It is important to note that *not all atoms* are capable of independent motion. Atoms which are part of rigid bodies are not "integrable objects" in the equations of motion; the rigid bodies themselves are the integrable objects. Therefore, the coordinate file contains coordinates of all the integrableObjects in the system. For systems without rigid bodies, this is simply the coordinates of all the atoms.

It is important to note that although the simulation propagates the complete rotation matrix, directional entities are written out using quaternions to save space in the output files.

There are three OPENMD files that are written using the combined format. They are: the initial startup file (.md), the simulation trajectory file (.dump), and the final coordinates or "end-of-run" for the simulation (.eor). The initial startup file is necessary for OPENMD to start the simulation with the proper coordinates, and this file must be generated by the user before the simulation run. The trajectory (or "dump") file is updated during simulation and is used to store snapshots of the coordinates at regular intervals. The first frame is a duplication of the initial configuration (the last good <Snapshot> in the startup file), and each subsequent frame is appended to the dump

```
<Snapshot>
 <FrameData>
      Time: 0
      Hmat: {{ Hxx, Hyx, Hzx }, { Hxy, Hyy, Hzy }, { Hxz, Hyz, Hzz }}
Thermostat: 0 , 0
 Barostat: {{ 0, 0, 0 }, { 0, 0, 0 }, { 0, 0, 0 }}
  </FrameData>
  <StuntDoubles>
       0
              pv
                          x y z vx vy vz
       1
              pv
                          x y z vx vy vz
       2
              pvqj
                           X Y Z VX VY VZ
                                           qw qx qy qz jx jy jz
       3
              ipvai
                           X V Z VX VV VZ
                                           qw qx qy qz jx jy jz
  </StuntDoubles>
</Snapshot>
```

Scheme 2.6: An example of the format of the <Snapshot> block. There is an initial sub-block called <FrameData> which contains the time stamp, the three column vectors of H, and optional extra information for the extended sytem ensembles. The lines in the <StuntDoubles> sub-block provide information about the instantaneous configuration of each integrable object. For each integrable object, the global index is followed by a short string describing what additional information is present on the line. Atoms with only position and velocity information use the "pv" string which must then be followed by the position and velocity vectors for that atom. Directional atoms and Rigid Bodies typically use the "pvqj" string which is followed by position, velocity, quaternions, and lastly, body fixed angular momentum for that integrable object.

file at an interval specified in the meta-data file with the sampleTime flag. The final coordinate file is the "end-of-run" file. The .eor file stores the final configuration of the system for a given simulation. The file is updated at the same time as the .dump file, but it only contains the most recent frame. In this way, an .eor file may be used to initialize a second simulation should it be necessary to recover from a crash or power outage. The coordinate files generated by OPENMD (both .dump and .eor) all contain the same <MetaData> block as the startup file, so they may be used to start up a new simulation if desired.

#### 2.5 Generation of Initial Coordinates

As was stated in Sec. 2.4, a meaningful <Snapshot> block is necessary for specifying for the starting coordinates for a simulation. Since each simulation is different, system creation is left to the end user; however, we have included a few sample programs which make some specialized structures. The <Snapshot> block must index the integrable objects in the correct order. The ordering of the integrable objects relies on the ordering of molecules within the <MetaData> block. OPENMD expects the order to comply with the following guidelines:

- 1. All of the molecules of the first declared component are given before proceeding to the molecules of the second component, and so on for all subsequently declared components.
- 2. The ordering of the atoms for each molecule follows the order declared in the molecule's declaration within the model file.
- 3. Only atoms which are not members of a rigidBody are included.

4. Rigid Body coordinates for a molecule are listed immediately after the other atoms in a molecule. Some molecules may be entirely rigid, in which case, only the rigid body coordinates are given.

An example is given in the OPENMD file in Scheme 2.7.

#### 2.6 The Statistics File

The last output file generated by OPENMD is the statistics file. This file records such statistical quantities as the instantaneous temperature (in K), volume (in  $\mathring{A}^3$ ), pressure (in atm), etc. It is written out with the frequency specified in the meta-data file with the statusTime keyword. The file allows the user to observe the system variables as a function of simulation time while the simulation is in progress. One useful function the statistics file serves is to monitor the conserved quantity of a given simulation ensemble, allowing the user to gauge the stability of the integrator. The statistics file is denoted with the .stat file extension.

```
<OpenMD>
  <MetaData>
molecule{
  name = "I2";
  atom[0]{
   type = "I";
  atom[1]{
   type = "I";
 bond{
   members (0, 1);
}
molecule{
 name = "HCl"
  atom[0]{
   type = "H";
  atom[1]{
   type = "Cl";
  }
 bond{
   members (0, 1);
component {
  type = "HC1";
  nMol = 4;
component {
  type = "I2";
 nMol = 1;
  </MetaData>
  <Snapshot>
    <FrameData>
        Hmat: {{ 10.0, 0.0, 0.0 }, { 0.0, 10.0, 0.0 }, { 0.0, 0.0, 10.0 }}
    </FrameData>
    <StuntDoubles>
         0
                pv
                             x y z vx vy vz // H from first HCl molecule
         1
                             x y z vx vy vz // Cl from first HCl molecule
                pv
         2
                pv
                             x y z vx vy vz // H from second HCl molecule
         3
                             x y z vx vy vz // Cl from second HCl molecule
                pv
         4
                             x y z vx vy vz // H from third HCl molecule
                pv
         5
                             x y z vx vy vz // Cl from third HCl molecule
                pv
         6
                pv
                             x y z vx vy vz // H from fourth HCl molecule
         7
                             x y z vx vy vz // Cl from fourth HCl molecule
                pv
         8
                             x y z vx vy vz // First I from I2 molecule
                pv
         9
                             x y z vx vy vz // Second I from I2 molecule
                pv
    </StuntDoubles>
  </Snapshot>
</OpenMD>
```

Scheme 2.7: Example declaration of the  $I_2$  molecule and the HCl molecule in <MetaData> and <Snapshot> blocks. Note that even though  $I_2$  is declared before HCl, the <Snapshot> block follows the order *in which the components were included*.

# **Chapter 3**

# The Empirical Energy Functions

Like many simulation packages, OPENMD splits the potential energy into the short-ranged (bonded) portion and a long-range (non-bonded) potential,

$$V = V_{\text{short-range}} + V_{\text{long-range}}.$$
 (3.1)

The short-ranged portion includes the explicit bonds, bends, and torsions which have been defined in the meta-data file for the molecules which are present in the simulation. The functional forms and parameters for these interactions are defined by the force field which is chosen.

Calculating the long-range (non-bonded) potential involves a sum over all pairs of atoms (except for those atoms which are involved in a bond, bend, or torsion with each other). If done poorly, calculating the the long-range interactions for N atoms would involve N(N-1)/2 evaluations of atomic distances. To reduce the number of distance evaluations between pairs of atoms, OPENMD uses a switched cutoff with Verlet neighbor lists.[12] It is well known that neutral groups which contain charges will exhibit pathological forces unless the cutoff is applied to the neutral groups evenly instead of to the individual atoms.[14] OPENMD allows users to specify cutoff groups which may contain an arbitrary number of atoms in the molecule. Atoms in a cutoff group are treated as a single unit for the evaluation of the switching function:

$$V_{\text{long-range}} = \sum_{a} \sum_{b>a} s(r_{ab}) \sum_{i \in a} \sum_{j \in b} V_{ij}(r_{ij}), \tag{3.2}$$

where  $r_{ab}$  is the distance between the centers of mass of the two cutoff groups (a and b).

The sums over a and b are over the cutoff groups that are present in the simulation. Atoms which are not explicitly defined as members of a cutoffGroup are treated as a group consisting of only one atom. The switching function, s(r) is the standard cubic switching function,

$$S(r) = \begin{cases} 1 & \text{if } r \leq r_{\text{sw}}, \\ \frac{(r_{\text{cut}} + 2r - 3r_{\text{sw}})(r_{\text{cut}} - r)^2}{(r_{\text{cut}} - r_{\text{sw}})^3} & \text{if } r_{\text{sw}} < r \leq r_{\text{cut}}, \\ 0 & \text{if } r > r_{\text{cut}}. \end{cases}$$
(3.3)

Here,  $r_{sw}$  is the switchingRadius, or the distance beyond which interactions are reduced, and  $r_{cut}$  is the cutoffRadius, or the distance at which interactions are truncated.

Users of OPENMD do not need to specify the cutoffRadius or switchingRadius. In simulations containing only Lennard-Jones atoms, the cutoff radius has a default value of  $2.5\sigma_{ii}$ , where  $\sigma_{ii}$  is the largest Lennard-Jones length parameter present in the simulation. In simulations containing charged or dipolar atoms, the default cutoff

```
<OpenMD>
  <MetaData>
#include "argon.md"

component{
  type = "Ar";
  nMol = 108;
}

forceField = "LJ";
  </MetaData>
  <Snapshot>  // not shown in this scheme
  </Snapshot>
</OpenMD>
```

Scheme 3.1: A sample startup file for a small Lennard-Jones simulation.

radius is 15Å.

The switchingRadius is set to a default value of 95% of the cutoffRadius. In the special case of a simulation containing *only* Lennard-Jones atoms, the default switching radius takes the same value as the cutoff radius, and OPENMD will use a shifted potential to remove discontinuities in the potential at the cutoff. Both radii may be specified in the meta-data file.

Force fields can be added to OPENMD, although it comes with a few simple examples (Lennard-Jones, DUFF, WATER, and EAM) which are explained in the following sections.

### 3.1 The Lennard Jones Force Field

The most basic force field implemented in OPENMD is the Lennard-Jones force field, which mimics the van der Waals interaction at long distances and uses an empirical repulsion at short distances. The Lennard-Jones potential is given by:

$$V_{\rm LJ}(r_{ij}) = 4\epsilon_{ij} \left[ \left( \frac{\sigma_{ij}}{r_{ij}} \right)^{12} - \left( \frac{\sigma_{ij}}{r_{ij}} \right)^{6} \right], \tag{3.4}$$

where  $r_{ij}$  is the distance between particles i and j,  $\sigma_{ij}$  scales the length of the interaction, and  $\epsilon_{ij}$  scales the well depth of the potential. Scheme 3.1 gives an example meta-data file that sets up a system of 108 Ar particles to be simulated using the Lennard-Jones force field.

Interactions between dissimilar particles requires the generation of cross term parameters for  $\sigma$  and  $\epsilon$ . These parameters are determined using the Lorentz-Berthelot mixing rules:[12]

$$\sigma_{ij} = \frac{1}{2} [\sigma_{ii} + \sigma_{jj}], \tag{3.5}$$

and

$$\epsilon_{ij} = \sqrt{\epsilon_{ii}\epsilon_{jj}}. ag{3.6}$$

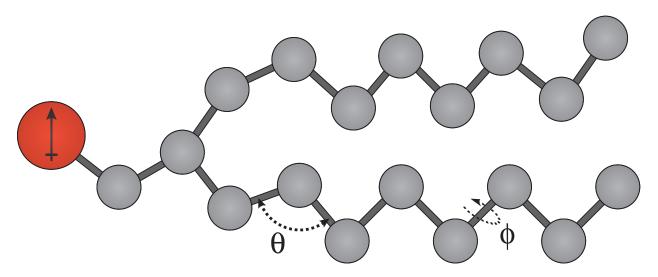


Figure 3.1: A representation of the lipid model.  $\phi$  is the torsion angle,  $\theta$  is the bend angle, and  $\mu$  is the dipole moment of the head group.

### 3.2 Dipolar Unified-Atom Force Field

The dipolar unified-atom force field (DUFF) was developed to simulate lipid bilayers. These types of simulations require a model capable of forming bilayers, while still being sufficiently computationally efficient to allow large systems ( $\sim$ 100's of phospholipids,  $\sim$ 1000's of waters) to be simulated for long times ( $\sim$ 10's of nanoseconds). With this goal in mind, DUFF has no point charges. Charge-neutral distributions are replaced with dipoles, while most atoms and groups of atoms are reduced to Lennard-Jones interaction sites. This simplification reduces the length scale of long range interactions from  $\frac{1}{r}$  to  $\frac{1}{r^3}$ , removing the need for the computationally expensive Ewald sum. Instead, Verlet neighbor-lists and cutoff radii are used for the dipolar interactions, and, if desired, a reaction field may be added to mimic longer range interactions.

As an example, lipid head-groups in DUFF are represented as point dipole interaction sites. Placing a dipole at the head group's center of mass mimics the charge separation found in common phospholipid head groups such as phosphatidylcholine.[15] Additionally, a large Lennard-Jones site is located at the pseudoatom's center of mass. The model is illustrated by the red atom in Fig. 3.1. The water model we use to complement the dipoles of the lipids is a reparameterization[16] of the soft sticky dipole (SSD) model of Ichiye *et al.*[17]

A set of scalable parameters has been used to model the alkyl groups with Lennard-Jones sites. For this, parameters from the TraPPE force field of Siepmann *et al.*[18] have been utilized. TraPPE is a unified-atom representation of nalkanes which is parametrized against phase equilibria using Gibbs ensemble Monte Carlo simulation techniques.[18] One of the advantages of TraPPE is that it generalizes the types of atoms in an alkyl chain to keep the number of pseudoatoms to a minimum; thus, the parameters for a unified atom such as CH<sub>2</sub> do not change depending on what species are bonded to it.

As is required by TraPPE, DUFF also constrains all bonds to be of fixed length. Typically, bond vibrations are the fastest motions in a molecular dynamic simulation. With these vibrations present, small time steps between force evaluations must be used to ensure adequate energy conservation in the bond degrees of freedom. By constraining the bond lengths, larger time steps may be used when integrating the equations of motion. A simulation using DUFF is illustrated in Scheme 3.2.

```
<OpenMD>
  <MetaData>
#include "water.md"
#include "lipid.md"
component {
  type = "simpleLipid_16";
  nMol = 60;
component {
  type = "SSD_water";
  nMol = 1936;
forceField = "DUFF";
  </MetaData>
  <Snapshot>
                  // not shown in this scheme
  </Snapshot>
</OpenMD>
```

Scheme 3.2: A portion of a startup file showing a simulation utilizing DUFF

#### 3.2.1 DUFF Energy Functions

The total potential energy function in DUFF is

$$V = \sum_{I=1}^{N} V_{\text{Internal}}^{I} + \sum_{I=1}^{N-1} \sum_{J>I} V_{\text{Cross}}^{IJ},$$
(3.7)

where  $V_{\text{Internal}}^{I}$  is the internal potential of molecule I:

$$V_{\text{Internal}}^{I} = \sum_{\theta_{ijk} \in I} V_{\text{bend}}(\theta_{ijk}) + \sum_{\phi_{ijkl} \in I} V_{\text{torsion}}(\phi_{ijkl}) + \sum_{i \in I} \sum_{(j>i+4) \in I} \left[ V_{\text{LJ}}(r_{ij}) + V_{\text{dipole}}(\mathbf{r}_{ij}, \mathbf{\Omega}_{i}, \mathbf{\Omega}_{j}) \right]. \tag{3.8}$$

Here  $V_{\text{bend}}$  is the bend potential for all 1, 3 bonded pairs within the molecule I, and  $V_{\text{torsion}}$  is the torsion potential for all 1, 4 bonded pairs. The pairwise portions of the non-bonded interactions are excluded for atom pairs that are involved in the smae bond, bend, or torsion. All other atom pairs within a molecule are subject to the LJ pair potential.

The bend potential of a molecule is represented by the following function:

$$V_{\text{bend}}(\theta_{ijk}) = k_{\theta}(\theta_{ijk} - \theta_0)^2, \tag{3.9}$$

where  $\theta_{ijk}$  is the angle defined by atoms i, j, and k (see Fig. 3.1),  $\theta_0$  is the equilibrium bond angle, and  $k_{\theta}$  is the force constant which determines the strength of the harmonic bend. The parameters for  $k_{\theta}$  and  $\theta_0$  are borrowed from those in TraPPE.[18]

The torsion potential and parameters are also borrowed from TraPPE. It is of the form:

$$V_{\text{torsion}}(\phi) = c_1[1 + \cos\phi] + c_2[1 + \cos(2\phi)] + c_3[1 + \cos(3\phi)], \tag{3.10}$$

where:

$$\cos \phi = (\hat{\mathbf{r}}_{ij} \times \hat{\mathbf{r}}_{jk}) \cdot (\hat{\mathbf{r}}_{jk} \times \hat{\mathbf{r}}_{kl}). \tag{3.11}$$

Here,  $\hat{\mathbf{r}}_{\alpha\beta}$  are the set of unit bond vectors between atoms i, j, k, and l. For computational efficiency, the torsion potential has been recast after the method of CHARMM,[1] in which the angle series is converted to a power series of the form:

$$V_{\text{torsion}}(\phi) = k_3 \cos^3 \phi + k_2 \cos^2 \phi + k_1 \cos \phi + k_0, \tag{3.12}$$

where:

$$k_0 = c_1 + c_3,$$
  
 $k_1 = c_1 - 3c_3,$   
 $k_2 = 2c_2,$   
 $k_3 = 4c_3.$ 

By recasting the potential as a power series, repeated trigonometric evaluations are avoided during the calculation of the potential energy.

The cross potential between molecules I and J,  $V_{\text{Cross}}^{IJ}$ , is as follows:

$$V_{\text{Cross}}^{IJ} = \sum_{i \in I} \sum_{i \in I} \left[ V_{\text{LJ}}(r_{ij}) + V_{\text{dipole}}(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j) + V_{\text{sticky}}(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j) \right], \tag{3.13}$$

where  $V_{LJ}$  is the Lennard Jones potential,  $V_{dipole}$  is the dipole dipole potential, and  $V_{sticky}$  is the sticky potential defined by the SSD model (Sec. 3.2.2). Note that not all atom types include all interactions.

The dipole-dipole potential has the following form:

$$V_{\text{dipole}}(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j) = \frac{|\mu_i||\mu_j|}{4\pi\epsilon_0 r_{ij}^3} \left[ \hat{\mathbf{u}}_i \cdot \hat{\mathbf{u}}_j - 3(\hat{\mathbf{u}}_i \cdot \hat{\mathbf{r}}_{ij})(\hat{\mathbf{u}}_j \cdot \hat{\mathbf{r}}_{ij}) \right]. \tag{3.14}$$

Here  $\mathbf{r}_{ij}$  is the vector starting at atom i pointing towards j, and  $\Omega_i$  and  $\Omega_j$  are the orientational degrees of freedom for atoms i and j respectively. The magnitude of the dipole moment of atom i is  $|\mu_i|$ ,  $\hat{\boldsymbol{u}}_i$  is the standard unit orientation vector of  $\Omega_i$ , and  $\hat{\boldsymbol{r}}_{ij}$  is the unit vector pointing along  $\mathbf{r}_{ij}$  ( $\hat{\boldsymbol{r}}_{ij} = \mathbf{r}_{ij}/|\mathbf{r}_{ij}|$ ).

#### 3.2.2 The DUFF Water Models: SSD/E and SSD/RF

In the interest of computational efficiency, the default solvent used by OPENMD is the extended Soft Sticky Dipole (SSD/E) water model.[16] The original SSD was developed by Ichiye *et al.*[17] as a modified form of the hard-sphere water model proposed by Bratko, Blum, and Luzar.[19, 20] It consists of a single point dipole with a Lennard-Jones core and a sticky potential that directs the particles to assume the proper hydrogen bond orientation in the first solvation shell. Thus, the interaction between two SSD water molecules *i* and *j* is given by the potential

$$V_{ij} = V_{ij}^{LJ}(r_{ij}) + V_{ij}^{dp}(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j) + V_{ij}^{sp}(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j),$$
(3.15)

where the  $\mathbf{r}_{ij}$  is the position vector between molecules i and j with magnitude equal to the distance  $r_{ij}$ , and  $\Omega_i$  and  $\Omega_j$  represent the orientations of the respective molecules. The Lennard-Jones and dipole parts of the potential are given by equations 3.4 and 3.14 respectively. The sticky part is described by the following,

$$u_{ij}^{sp}(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j) = \frac{\nu_0}{2} [s(r_{ij})w(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j) + s'(r_{ij})w'(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j)], \qquad (3.16)$$

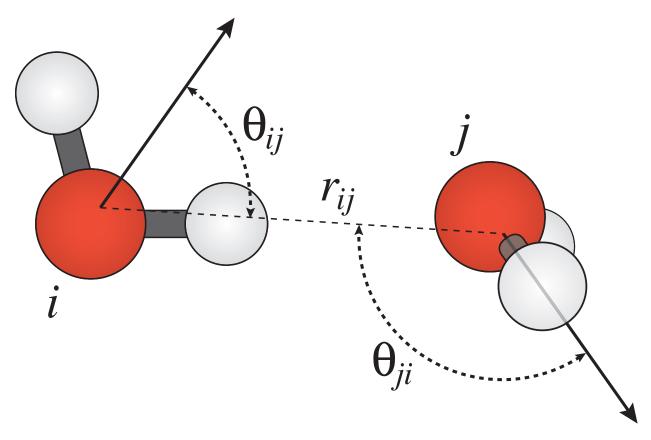


Figure 3.2: Coordinates for the interaction between two SSD/E water molecules.  $\theta_{ij}$  is the angle that  $r_{ij}$  makes with the  $\hat{z}$  vector in the body-fixed frame for molecule i. The  $\hat{z}$  vector bisects the HOH angle in each water molecule.

where  $\nu_0$  is a strength parameter for the sticky potential, and s and s' are cubic switching functions which turn off the sticky interaction beyond the first solvation shell. The w function can be thought of as an attractive potential with tetrahedral geometry:

$$w(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_i) = \sin \theta_{ij} \sin 2\theta_{ij} \cos 2\phi_{ij}, \tag{3.17}$$

while the w' function counters the normal aligned and anti-aligned structures favored by point dipoles:

$$w'(\mathbf{r}_{ij}, \mathbf{\Omega}_i, \mathbf{\Omega}_j) = (\cos \theta_{ij} - 0.6)^2 (\cos \theta_{ij} + 0.8)^2 - w^0,$$
(3.18)

It should be noted that w is proportional to the sum of the  $Y_3^2$  and  $Y_3^{-2}$  spherical harmonics (a linear combination which enhances the tetrahedral geometry for hydrogen bonded structures), while w' is a purely empirical function. A more detailed description of the functional parts and variables in this potential can be found in the original SSD articles.[17, 21, 22, 23]

Since SSD/E is a single-point *dipolar* model, the force calculations are simplified significantly relative to the standard *charged* multi-point models. In the original Monte Carlo simulations using this model, Ichiye *et al.* reported that using SSD decreased computer time by a factor of 6-7 compared to other models.[17] What is most impressive is that these savings did not come at the expense of accurate depiction of the liquid state properties. Indeed, SSD/E maintains reasonable agreement with the Head-Gordon diffraction data for the structural features of liquid water.[24, 17] Additionally, the dynamical properties exhibited by SSD/E agree with experiment better than those of more computationally expensive models (like TIP3P and SPC/E).[22] The combination of speed and accurate depiction of solvent properties makes SSD/E a very attractive model for the simulation of large scale biochemical simulations.

Recent constant pressure simulations revealed issues in the original SSD model that led to lower than expected densities at all target pressures.[23, 16] The default model in OPENMD is therefore SSD/E, a density corrected derivative of SSD that exhibits improved liquid structure and transport behavior. If the use of a reaction field long-range interaction correction is desired, it is recommended that the parameters be modified to those of the SSD/RF model (an SSD variant parameterized for reaction field). These solvent parameters are listed and can be easily modified in the DUFF force field file (DUFF.frc). A table of the parameter values and the drawbacks and benefits of the different density corrected SSD models can be found in reference [16].

#### 3.3 The WATER Force Field

In addition to the DUFF force field's solvent description, a separate WATER force field has been included for simulating most of the common rigid-body water models. This force field includes the simple and point-dipolar models (SSD, SSD1, SSD/E, SSD/RF, and DPD water), as well as the common charge-based models (SPC, SPC/E, TIP3P, TIP4P, and TIP5P).[17, 23, 16, 25, 26, 27, 28, 29] In order to handle these models, charge-charge interactions were included in the force-loop:

$$V_{\text{charge}}(r_{ij}) = \sum_{ij} \frac{q_i q_j e^2}{r_{ij}},\tag{3.19}$$

where q represents the charge on particle i or j, and e is the charge of an electron in Coulombs. The charge-charge interaction support is rudimentary in the current version of OPENMD. As with the other pair interactions, charges can be simulated with a pure cutoff or a reaction field. The various methods for performing the Ewald summation have not yet been included. The WATER force field can be easily expanded through modification of the WATER force field file (WATER.frc). By adding atom types and inserting the appropriate parameters, it is possible to extend the force field to handle rigid molecules other than water.

#### 3.4 Embedded Atom Method

OPENMD implements a potential that describes bonding in transition metal systems. [30, 31, 32, 33, 34] This potential has an attractive interaction which models "Embedding" a positively charged pseudo-atom core in the electron density due to the free valance "sea" of electrons created by the surrounding atoms in the system. A pairwise part of the potential (which is primarily repulsive) describes the interaction of the positively charged metal core ions with one another. The Embedded Atom Method (EAM) [35, 36, 37, 38] has been widely adopted in the materials science community and has been included in OPENMD. A good review of EAM and other formulations of metallic potentials was given by Voter.[39]

The EAM potential has the form:

$$V = \sum_{i} F_{i} \left[\rho_{i}\right] + \sum_{i} \sum_{j \neq i} \phi_{ij}(\mathbf{r}_{ij})$$
(3.20)

where  $F_i$  is an embedding functional that approximates the energy required to embed a positively-charged core ion i into a linear superposition of spherically averaged atomic electron densities given by  $\rho_i$ ,

$$\rho_i = \sum_{j \neq i} f_j(\mathbf{r}_{ij}),\tag{3.21}$$

Since the density at site i ( $\rho_i$ ) must be computed before the embedding functional can be evaluated, EAM and the related transition metal potentials require two loops through the atom pairs to compute the inter-atomic forces.

The pairwise portion of the potential,  $\phi_{ij}$ , is a primarily repulsive interaction between atoms i and j. In the original formulation of EAM[35],  $\phi_{ij}$  was an entirely repulsive term; however later refinements to EAM allowed for more general forms for  $\phi$ .[40] The effective cutoff distance,  $r_{cut}$  is the distance at which the values of f(r) and  $\phi(r)$  drop to zero for all atoms present in the simulation. In practice, this distance is fairly small, limiting the summations in the EAM equation to the few dozen atoms surrounding atom i for both the density  $\rho$  and pairwise  $\phi$  interactions.

In computing forces for alloys, mixing rules as outlined by Johnson [37] are used to compute the heterogenous pair potential,

$$\phi_{ab}(r) = \frac{1}{2} \left( \frac{f_b(r)}{f_a(r)} \phi_{aa}(r) + \frac{f_a(r)}{f_b(r)} \phi_{bb}(r) \right). \tag{3.22}$$

No mixing rule is needed for the densities, since the density at site i is simply the linear sum of density contributions of all the other atoms.

The EAM force field illustrates an additional feature of OPENMD. Foiles, Baskes and Daw fit EAM potentials for Cu, Ag, Au, Ni, Pd, Pt and alloys of these metals.[36] These fits are included in OPENMD as the u3 variant of the EAM force field. Voter and Chen reparamaterized a set of EAM functions which do a better job of predicting melting points.[41] These functions are included in OPENMD as the VC variant of the EAM force field. An additional set of functions (the "Universal 6" functions) are included in OPENMD as the u6 variant of EAM. For example, to specify the Voter-Chen variant of the EAM force field, the user would add the forceFieldVariant = "VC"; line to the meta-data file.

The potential files used by the EAM force field are in the standard funcfl format, which is the format utilized by a number of other codes (e.g. ParaDyn [8], DYNAMO 86). It should be noted that the energy units in these files are in eV, not kcal mol<sup>-1</sup> as in the rest of the OPENMD force field files.

#### 3.5 The Sutton-Chen Force Field

The Sutton-Chen (SC) [32] potential has been used to study a wide range of phenomena in metals. Although it is similar in form to the EAM potential, the Sutton-Chen model takes on a simpler form,

$$U_{tot} = \sum_{i} \left[ \frac{1}{2} \sum_{j \neq i} D_{ij} V_{ij}^{pair}(r_{ij}) - c_i D_{ii} \sqrt{\rho_i} \right],$$
 (3.23)

where  $V_{ij}^{pair}$  and  $\rho_i$  are given by

$$V_{ij}^{pair}(r) = \left(\frac{\alpha_{ij}}{r_{ij}}\right)^{n_{ij}}, \rho_i = \sum_{j \neq i} \left(\frac{\alpha_{ij}}{r_{ij}}\right)^{m_{ij}}$$
(3.24)

 $V_{ij}^{pair}$  is a repulsive pairwise potential that accounts for interactions of the pseudo-atom cores. The  $\sqrt{\rho_i}$  term in Eq. (3.23) is an attractive many-body potential that models the interactions between the valence electrons and the cores of the pseudo-atoms.  $D_{ij}$ ,  $D_{ii}$ ,  $c_i$  and  $\alpha_{ij}$  are parameters used to tune the potential for different transition metals.

The SC potential form has also been parameterized by Qi *et al.*[33] These parameters were obtained via empirical and *ab initio* calculations to match structural features of the FCC crystal. To specify the original Sutton-Chen variant of the SC force field, the user would add the forceFieldVariant = "SC"; line to the meta-data file, while specification of the Qi *et al.* quantum-adapted variant of the SC potential, the user would add the forceFieldVariant = "QSC"; line to the meta-data file.

#### 3.6 The CLAY force field

The CLAY force field is based on an ionic (nonbonded) description of the metal-oxygen interactions associated with hydrated phases. All atoms are represented as point charges and are allowed complete translational freedom. Metal-oxygen interactions are based on a simple Lennard-Jones potential combined with electrostatics. The empirical parameters were optimized by Cygan *et al.*[42] on the basis of known mineral structures, and partial atomic charges were derived from periodic DFT quantum chemical calculations of simple oxide, hydroxide, and oxyhydroxide model compounds with well-defined structures.

#### 3.7 Electrostatics

To aid in performing simulations in more traditional force fields, we have added routines to carry out electrostatic interactions using a number of different electrostatic summation methods. These methods are extended from the damped and cutoff-neutralized Coulombic sum originally proposed by Wolf, *et al.*[43] One of these, the damped shifted force method, shows a remarkable ability to reproduce the energetic and dynamic characteristics exhibited by simulations employing lattice summation techniques. The basic idea is to construct well-behaved real-space summation methods using two tricks:

- 1. shifting through the use of image charges, and
- 2. damping the electrostatic interaction.

Starting with the original observation that the effective range of the electrostatic interaction in condensed phases is considerably less than  $r^{-1}$ , either the cutoff sphere neutralization or the distance-dependent damping technique could be used as a foundation for a new pairwise summation method. Wolf *et al.* made the observation that charge neutralization within the cutoff sphere plays a significant role in energy convergence; therefore we will begin our analysis with the various shifted forms that maintain this charge neutralization. We can evaluate the methods of Wolf *et al.* and Zahn *et al.* by considering the standard shifted potential,

$$V_{\rm SP}(r) = \begin{cases} v(r) - v_{\rm c} & r \leqslant R_{\rm c} \\ 0 & r > R_{\rm c} \end{cases}, \tag{3.25}$$

and shifted force,

$$V_{\rm SF}(r) = \begin{cases} v(r) - v_{\rm c} - \left(\frac{dv(r)}{dr}\right)_{r=R_{\rm c}} (r - R_{\rm c}) & r \leqslant R_{\rm c} \\ 0 & r > R_{\rm c} \end{cases}, \tag{3.26}$$

functions where v(r) is the unshifted form of the potential, and  $v_c$  is  $v(R_c)$ . The Shifted Force (SF) form ensures that both the potential and the forces goes to zero at the cutoff radius, while the Shifted Potential (SP) form only ensures the potential is smooth at the cutoff radius  $(R_c)$ .[12]

The forces associated with the shifted potential are simply the forces of the unshifted potential itself (when inside the cutoff sphere),

$$F_{\rm SP} = -\left(\frac{dv(r)}{dr}\right),\tag{3.27}$$

and are zero outside. Inside the cutoff sphere, the forces associated with the shifted force form can be written,

$$F_{\rm SF} = -\left(\frac{dv(r)}{dr}\right) + \left(\frac{dv(r)}{dr}\right)_{r=R_{\rm o}}.$$
(3.28)

If the potential, v(r), is taken to be the normal Coulomb potential,

$$v(r) = \frac{q_i q_j}{r},\tag{3.29}$$

then the Shifted Potential (SP) forms will give Wolf et al.'s undamped prescription:

$$V_{\rm SP}(r) = q_i q_j \left(\frac{1}{r} - \frac{1}{R_{\rm c}}\right) \quad r \leqslant R_{\rm c}, \tag{3.30}$$

with associated forces,

$$F_{\rm SP}(r) = q_i q_j \left(\frac{1}{r^2}\right) \quad r \leqslant R_{\rm c} \,. \tag{3.31}$$

These forces are identical to the forces of the standard Coulomb interaction, and cutting these off at  $R_c$  was addressed by Wolf *et al.* as undesirable. They pointed out that the effect of the image charges is neglected in the forces when this form is used,[43] thereby eliminating any benefit from the method in molecular dynamics. Additionally, there is a discontinuity in the forces at the cutoff radius which results in energy drift during MD simulations.

The shifted force (SF) form using the normal Coulomb potential will give,

$$V_{\rm SF}(r) = q_i q_j \left[ \frac{1}{r} - \frac{1}{R_{\rm c}} + \left( \frac{1}{R_{\rm c}^2} \right) (r - R_{\rm c}) \right] \quad r \leqslant R_{\rm c}.$$
 (3.32)

with associated forces.

$$F_{\rm SF}(r) = q_i q_j \left(\frac{1}{r^2} - \frac{1}{R_{\rm c}^2}\right) \quad r \leqslant R_{\rm c}.$$
 (3.33)

This formulation has the benefits that there are no discontinuities at the cutoff radius, while the neutralizing image charges are present in both the energy and force expressions. It would be simple to add the self-neutralizing term back when computing the total energy of the system, thereby maintaining the agreement with the Madelung energies. A side effect of this treatment is the alteration in the shape of the potential that comes from the derivative term. Thus, a degree of clarity about agreement with the empirical potential is lost in order to gain functionality in dynamics simulations.

Wolf *et al.* originally discussed the energetics of the shifted Coulomb potential (Eq. 3.30) and found that it was insufficient for accurate determination of the energy with reasonable cutoff distances. The calculated Madelung energies fluctuated around the expected value as the cutoff radius was increased, but the oscillations converged toward the correct value.[43] A damping function was incorporated to accelerate the convergence; and though alternative forms for the damping function could be used,[44, 45] the complimentary error function was chosen to mirror the effective screening used in the Ewald summation. Incorporating this error function damping into the simple Coulomb potential,

$$v(r) = \frac{\operatorname{erfc}(\alpha r)}{r},\tag{3.34}$$

the shifted potential (eq. (3.30)) becomes

$$V_{\rm DSP}(r) = q_i q_j \left( \frac{\text{erfc}(\alpha r)}{r} - frac\text{erfc}(\alpha R_{\rm c}) R_{\rm c} \right) \quad r \leqslant R_{\rm c}, \tag{3.35}$$

with associated forces.

$$F_{\rm DSP}(r) = q_i q_j \left( \frac{\operatorname{erfc}(\alpha r)}{r^2} + \frac{2\alpha}{\pi^{1/2}} \frac{\exp\left(-\alpha^2 r^2\right)}{r} \right) \quad r \leqslant R_{\rm c}. \tag{3.36}$$

Again, this damped shifted potential suffers from a force-discontinuity at the cutoff radius, and the image charges play no role in the forces. To remedy these concerns, one may derive a SF variant by including the derivative term in eq. (3.26),

$$V_{\rm DSF}(r) = q_i q_j \left[ \frac{\operatorname{erfc}(\alpha r)}{r} - \frac{\operatorname{erfc}(\alpha R_{\rm c})}{R_{\rm c}} + \left( \frac{\operatorname{erfc}(\alpha R_{\rm c})}{R_{\rm c}^2} + \frac{2\alpha}{\pi^{1/2}} \frac{\exp\left(-\alpha^2 R_{\rm c}^2\right)}{R_{\rm c}} \right) (r - R_{\rm c}) \right] \quad r \leqslant R_{\rm c}$$

$$(3.37)$$

The derivative of the above potential will lead to the following forces,

$$F_{\text{DSF}}(r) = q_i q_j \left[ \left( \frac{\text{erfc}(\alpha r)}{r^2} + \frac{2\alpha}{\pi^{1/2}} \frac{\exp(-\alpha^2 r^2)}{r} \right) - \left( \frac{\text{erfc}(\alpha R_c)}{R_c^2} + \frac{2\alpha}{\pi^{1/2}} \frac{\exp(-\alpha^2 R_c^2)}{R_c} \right) \right] \quad r \leqslant R_c.$$
(3.38)

If the damping parameter ( $\alpha$ ) is set to zero, the undamped case, eqs. (3.30 through 3.33) are correctly recovered from eqs. (3.35 through 3.38).

It has been shown that the Damped Shifted Force method obtains nearly identical behavior to the smooth particle mesh Ewald (SPME) method on a number of commonly simulated systems. [46] For this reason, the default electrostatic summation method utilized by OPENMD is the DSF (Eq. 3.37) with a damping parameter ( $\alpha$ ) that is set algorithmically from the cutoff radius.

## 3.8 Periodic Boundary Conditions

Periodic boundary conditions are widely used to simulate bulk properties with a relatively small number of particles. In this method the simulation box is replicated throughout space to form an infinite lattice. During the simulation, when a particle moves in the primary cell, its image in other cells move in exactly the same direction with exactly the same orientation. Thus, as a particle leaves the primary cell, one of its images will enter through the opposite face. If the simulation box is large enough to avoid "feeling" the symmetries of the periodic lattice, surface effects can be ignored. The available periodic cells in OPENMD are cubic, orthorhombic and parallelepiped. OPENMD use a  $3 \times 3$  matrix, H, to describe the shape and size of the simulation box. H is defined:

$$\mathsf{H} = (\mathbf{h}_x, \mathbf{h}_y, \mathbf{h}_z),\tag{3.39}$$

where  $\mathbf{h}_{\alpha}$  is the column vector of the  $\alpha$  axis of the box. During the course of the simulation both the size and shape of the box can be changed to allow volume fluctuations when constraining the pressure.

A real space vector,  $\mathbf{r}$  can be transformed in to a box space vector,  $\mathbf{s}$ , and back through the following transformations:

$$\mathbf{s} = \mathsf{H}^{-1}\mathbf{r},\tag{3.40}$$

$$\mathbf{r} = \mathsf{Hs}.\tag{3.41}$$

The vector s is now a vector expressed as the number of box lengths in the  $\mathbf{h}_x$ ,  $\mathbf{h}_y$ , and  $\mathbf{h}_z$  directions. To find the minimum image of a vector r, OPENMD first converts it to its corresponding vector in box space, and then casts each

element to lie in the range [-0.5, 0.5]:

$$s_i' = s_i - \text{round}(s_i), \tag{3.42}$$

where  $s_i$  is the *i*th element of s, and round $(s_i)$  is given by

$$\operatorname{round}(x) = \begin{cases} \lfloor x + 0.5 \rfloor & \text{if } x \ge 0, \\ \lceil x - 0.5 \rceil & \text{if } x < 0. \end{cases}$$
(3.43)

Here  $\lfloor x \rfloor$  is the floor operator, and gives the largest integer value that is not greater than x, and  $\lceil x \rceil$  is the ceiling operator, and gives the smallest integer that is not less than x.

Finally, the minimum image coordinates  $\mathbf{r}'$  are obtained by transforming back to real space,

$$\mathbf{r}' = \mathsf{H}^{-1}\mathbf{s}'. \tag{3.44}$$

In this way, particles are allowed to diffuse freely in  $\mathbf{r}$ , but their minimum images, or  $\mathbf{r}'$ , are used to compute the inter-atomic forces.

# **Chapter 4**

## **Mechanics**

## 4.1 Integrating the Equations of Motion: the DLM method

The default method for integrating the equations of motion in OPENMD is a velocity-Verlet version of the symplectic splitting method proposed by Dullweber, Leimkuhler and McLachlan (DLM).[47] When there are no directional atoms or rigid bodies present in the simulation, this integrator becomes the standard velocity-Verlet integrator which is known to sample the microcanonical (NVE) ensemble.[48]

Previous integration methods for orientational motion have problems that are avoided in the DLM method. Direct propagation of the Euler angles has a known  $1/\sin\theta$  divergence in the equations of motion for  $\phi$  and  $\psi$ ,[12] leading to numerical instabilities any time one of the directional atoms or rigid bodies has an orientation near  $\theta=0$  or  $\theta=\pi$ . Quaternion-based integration methods work well for propagating orientational motion; however, energy conservation concerns arise when using the microcanonical (NVE) ensemble. An earlier implementation of OPENMD utilized quaternions for propagation of rotational motion; however, a detailed investigation showed that they resulted in a steady drift in the total energy, something that has been observed by Laird *et al.*[49]

The key difference in the integration method proposed by Dullweber  $et\ al.$  is that the entire  $3\times 3$  rotation matrix is propagated from one time step to the next. In the past, this would not have been feasible, since the rotation matrix for a single body has nine elements compared with the more memory-efficient methods (using three Euler angles or 4 quaternions). Computer memory has become much less costly in recent years, and this can be translated into substantial benefits in energy conservation.

The basic equations of motion being integrated are derived from the Hamiltonian for conservative systems containing rigid bodies,

$$H = \sum_{i} \left( \frac{1}{2} m_{i} \mathbf{v}_{i}^{T} \cdot \mathbf{v}_{i} + \frac{1}{2} \mathbf{j}_{i}^{T} \cdot \overrightarrow{\mathsf{I}}_{i}^{-1} \cdot \mathbf{j}_{i} \right) + V\left( \left\{ \mathbf{r} \right\}, \left\{ \mathsf{A} \right\} \right), \tag{4.1}$$

where  $\mathbf{r}_i$  and  $\mathbf{v}_i$  are the cartesian position vector and velocity of the center of mass of particle i, and  $\mathbf{j}_i$ ,  $\overrightarrow{\mathbf{l}}_i$  are the body-fixed angular momentum and moment of inertia tensor respectively, and the superscript T denotes the transpose of the vector.  $\mathbf{A}_i$  is the  $3 \times 3$  rotation matrix describing the instantaneous orientation of the particle. V is the potential energy function which may depend on both the positions  $\{\mathbf{r}\}$  and orientations  $\{\mathbf{A}\}$  of all particles. The equations of motion for the particle centers of mass are derived from Hamilton's equations and are quite simple,

$$\dot{\mathbf{r}} = \mathbf{v},$$
 (4.2)

$$\dot{\mathbf{v}} = \frac{\mathbf{f}}{m},\tag{4.3}$$

where f is the instantaneous force on the center of mass of the particle,

$$\mathbf{f} = -\frac{\partial}{\partial \mathbf{r}} V(\{\mathbf{r}(t)\}, \{\mathsf{A}(t)\}). \tag{4.4}$$

The equations of motion for the orientational degrees of freedom are

$$\dot{A} = A \cdot \text{skew} \left( \overrightarrow{I}^{-1} \cdot \mathbf{j} \right),$$
 (4.5)

$$\dot{\mathbf{j}} = \mathbf{j} \times \left( \overleftrightarrow{\mathsf{I}}^{-1} \cdot \mathbf{j} \right) - \operatorname{rot} \left( \mathsf{A}^T \cdot \frac{\partial V}{\partial \mathsf{A}} \right). \tag{4.6}$$

In these equations of motion, the skew matrix of a vector  $\mathbf{v} = (v_1, v_2, v_3)$  is defined:

$$\operatorname{skew}(\mathbf{v}) := \begin{pmatrix} 0 & v_3 & -v_2 \\ -v_3 & 0 & v_1 \\ v_2 & -v_1 & 0 \end{pmatrix}. \tag{4.7}$$

The rot notation refers to the mapping of the  $3 \times 3$  rotation matrix to a vector of orientations by first computing the skew-symmetric part  $(A - A^T)$  and then associating this with a length 3 vector by inverting the skew function above:

$$rot(A) := skew^{-1}(A - A^{T}). \tag{4.8}$$

Written this way, the rot operation creates a set of conjugate angle coordinates to the body-fixed angular momenta represented by **j**. This equation of motion for angular momenta is equivalent to the more familiar body-fixed forms,

$$\dot{j}_x = \tau_x^b(t) - \left( \overrightarrow{\Gamma}_{yy}^{-1} - \overrightarrow{\Gamma}_{zz}^{-1} \right) j_y j_z, \tag{4.9}$$

$$\dot{j}_y = \tau_y^b(t) - \left( \overrightarrow{\mathsf{T}}_{zz}^{-1} - \overrightarrow{\mathsf{T}}_{xx}^{-1} \right) j_z j_x, \tag{4.10}$$

$$\dot{j}_z = \tau_z^b(t) - \left( \overrightarrow{\mathsf{T}}_{xx}^{-1} - \overrightarrow{\mathsf{T}}_{yy}^{-1} \right) j_x j_y, \tag{4.11}$$

which utilize the body-fixed torques,  $\tau^b$ . Torques are most easily derived in the space-fixed frame,

$$\tau^b(t) = \mathsf{A}(t) \cdot \tau^s(t),\tag{4.12}$$

where the torques are either derived from the forces on the constituent atoms of the rigid body, or for directional atoms, directly from derivatives of the potential energy,

$$\tau^{s}(t) = -\hat{\mathbf{u}}(t) \times \left(\frac{\partial}{\partial \hat{\mathbf{u}}} V\left(\left\{\mathbf{r}(t)\right\}, \left\{\mathsf{A}(t)\right\}\right)\right). \tag{4.13}$$

Here  $\hat{\mathbf{u}}$  is a unit vector pointing along the principal axis of the particle in the space-fixed frame.

The DLM method uses a Trotter factorization of the orientational propagator. This has three effects:

- 1. the integrator is area-preserving in phase space (i.e. it is *symplectic*),
- 2. the integrator is time-reversible, making it suitable for Hybrid Monte Carlo applications, and
- 3. the error for a single time step is of order  $\mathcal{O}(h^4)$  for timesteps of length h.

The integration of the equations of motion is carried out in a velocity-Verlet style 2-part algorithm, where  $h = \delta t$ :

moveA:

$$\mathbf{v}(t+h/2) \leftarrow \mathbf{v}(t) + \frac{h}{2}(\mathbf{f}(t)/m),$$

$$\mathbf{r}(t+h) \leftarrow \mathbf{r}(t) + h\mathbf{v}(t+h/2),$$

$$\mathbf{j}(t+h/2) \leftarrow \mathbf{j}(t) + \frac{h}{2}\tau^{b}(t),$$

$$\mathbf{A}(t+h) \leftarrow \text{rotate}\left(h\mathbf{j}(t+h/2) \cdot \overrightarrow{\mathsf{I}}^{-1}\right).$$

In this context, the rotate function is the reversible product of the three body-fixed rotations,

$$rotate(\mathbf{a}) = \mathsf{G}_x(a_x/2) \cdot \mathsf{G}_y(a_y/2) \cdot \mathsf{G}_z(a_z) \cdot \mathsf{G}_y(a_y/2) \cdot \mathsf{G}_x(a_x/2), \tag{4.14}$$

where each rotational propagator,  $G_{\alpha}(\theta)$ , rotates both the rotation matrix (A) and the body-fixed angular momentum (j) by an angle  $\theta$  around body-fixed axis  $\alpha$ ,

$$\mathsf{G}_{\alpha}(\theta) = \begin{cases} \mathsf{A}(t) & \leftarrow & \mathsf{A}(0) \cdot \mathsf{R}_{\alpha}(\theta)^{T}, \\ \mathbf{j}(t) & \leftarrow & \mathsf{R}_{\alpha}(\theta) \cdot \mathbf{j}(0). \end{cases}$$
(4.15)

 $R_{\alpha}$  is a quadratic approximation to the single-axis rotation matrix. For example, in the small-angle limit, the rotation matrix around the body-fixed x-axis can be approximated as

$$R_{x}(\theta) \approx \begin{pmatrix} 1 & 0 & 0 \\ 0 & \frac{1-\theta^{2}/4}{1+\theta^{2}/4} & -\frac{\theta}{1+\theta^{2}/4} \\ 0 & \frac{\theta}{1+\theta^{2}/4} & \frac{1-\theta^{2}/4}{1+\theta^{2}/4} \end{pmatrix}.$$
(4.16)

All other rotations follow in a straightforward manner.

After the first part of the propagation, the forces and body-fixed torques are calculated at the new positions and orientations

doForces:

$$\mathbf{f}(t+h) \leftarrow -\left(\frac{\partial V}{\partial \mathbf{r}}\right)_{\mathbf{r}(t+h)},$$

$$\tau^{s}(t+h) \leftarrow \mathbf{u}(t+h) \times \frac{\partial V}{\partial \mathbf{u}},$$

$$\tau^{b}(t+h) \leftarrow \mathsf{A}(t+h) \cdot \tau^{s}(t+h).$$

OPENMD automatically updates  $\mathbf{u}$  when the rotation matrix A is calculated in moveA. Once the forces and torques have been obtained at the new time step, the velocities can be advanced to the same time value.

moveB:

$$\mathbf{v}(t+h) \leftarrow \mathbf{v}(t+h/2) + \frac{h}{2}(\mathbf{f}(t+h)/m),$$
$$\mathbf{j}(t+h) \leftarrow \mathbf{j}(t+h/2) + \frac{h}{2}\tau^{b}(t+h).$$

The matrix rotations used in the DLM method end up being more costly computationally than the simpler arithmetic quaternion propagation. With the same time step, a 1024-molecule water simulation incurs an average 12% increase in computation time using the DLM method in place of quaternions. This cost is more than justified when comparing

the energy conservation achieved by the two methods. Figure 4.1 provides a comparative analysis of the DLM method versus the traditional quaternion scheme.

In Fig. 4.1,  $\delta E_1$  is a measure of the linear energy drift in units of kcal mol<sup>-1</sup> per particle over a nanosecond of simulation time, and  $\delta E_0$  is the standard deviation of the energy fluctuations in units of kcal mol<sup>-1</sup> per particle. In the top plot, it is apparent that the energy drift is reduced by a significant amount (2 to 3 orders of magnitude improvement at all tested time steps) by chosing the DLM method over the simple non-symplectic quaternion integration method. In addition to this improvement in energy drift, the fluctuations in the total energy are also dampened by 1 to 2 orders of magnitude by utilizing the DLM method.

Although the DLM method is more computationally expensive than the traditional quaternion scheme for propagating a single time step, consideration of the computational cost for a long simulation with a particular level of energy conservation is in order. A plot of energy drift versus computational cost was generated (Fig. 4.2). This figure provides an estimate of the CPU time required under the two integration schemes for 1 nanosecond of simulation time for the model 1024-molecule system. By chosing a desired energy drift value it is possible to determine the CPU time required for both methods. If a  $\delta E_1$  of  $1 \times 10^{-3}$ kcal mol<sup>-1</sup> per particle is desired, a nanosecond of simulation time will require 19 hours of CPU time with the DLM integrator, while the quaternion scheme will require 154 hours of CPU time. This demonstrates the computational advantage of the integration scheme utilized in OPENMD.

There is only one specific keyword relevant to the default integrator, and that is the time step for integrating the equations of motion.

variable	Meta-data keyword	units	default value
h.	dt = 2.0:	fs	none

## 4.2 Extended Systems for other Ensembles

OPENMD implements a number of extended system integrators for sampling from other ensembles relevant to chemical physics. The integrator can be selected with the ensemble keyword in the meta-data file:

Integrator	Ensemble	Meta-data instruction
NVE	microcanonical	ensemble = NVE;
NVT	canonical	ensemble = NVT;
NPTi	isobaric-isothermal	ensemble = NPTi;
	(with isotropic volume changes)	
NPTf	isobaric-isothermal	<pre>ensemble = NPTf;</pre>
	(with changes to box shape)	
NPTxyz	approximate isobaric-isothermal	ensemble = NPTxyz;
	(with separate barostats on each box dimension)	
LD	Langevin Dynamics	ensemble = LD;
	(approximates the effects of an implicit solvent)	

The relatively well-known Nosé-Hoover thermostat[50] is implemented in OPENMD's NVT integrator. This method couples an extra degree of freedom (the thermostat) to the kinetic energy of the system and it has been shown to sample the canonical distribution in the system degrees of freedom while conserving a quantity that is, to within a constant, the Helmholtz free energy.[51]

NPT algorithms attempt to maintain constant pressure in the system by coupling the volume of the system to a barostat. OPENMD contains three different constant pressure algorithms. The first two, NPTi and NPTf have been shown to conserve a quantity that is, to within a constant, the Gibbs free energy.[51] The Melchionna modification to the Hoover barostat is implemented in both NPTi and NPTf. NPTi allows only isotropic changes in the simulation

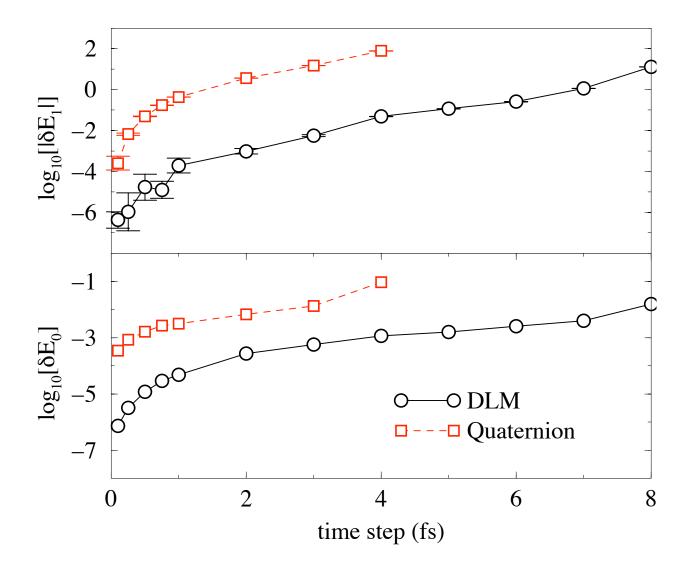


Figure 4.1: Analysis of the energy conservation of the DLM and quaternion integration methods.  $\delta E_1$  is the linear drift in energy over time and  $\delta E_0$  is the standard deviation of energy fluctuations around this drift. All simulations were of a 1024-molecule simulation of SSD water at 298 K starting from the same initial configuration. Note that the DLM method provides more than an order of magnitude improvement in both the energy drift and the size of the energy fluctuations when compared with the quaternion method at any given time step. At time steps larger than 4 fs, the quaternion scheme resulted in rapidly rising energies which eventually lead to simulation failure. Using the DLM method, time steps up to 8 fs can be taken before this behavior is evident.

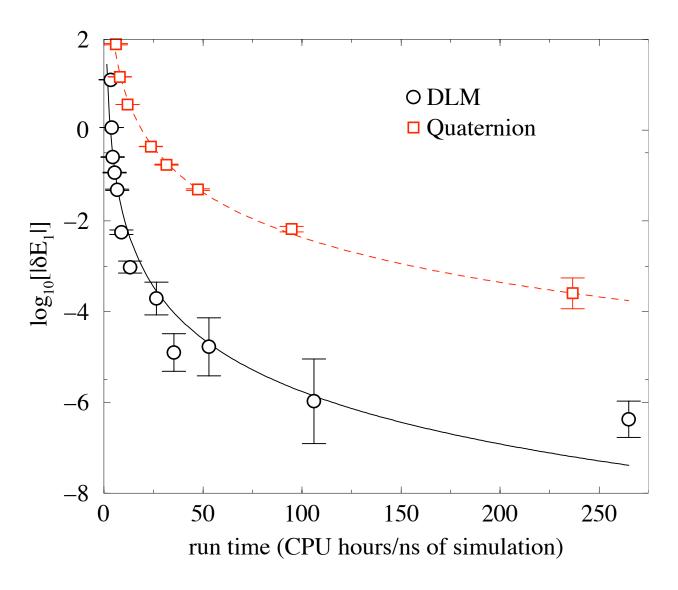


Figure 4.2: Energy drift as a function of required simulation run time.  $\delta E_1$  is the linear drift in energy over time. Simulations were performed on a single 2.5 GHz Pentium 4 processor. Simulation time comparisons can be made by tracing horizontally from one curve to the other. For example, a simulation that takes 24 hours using the DLM method will take roughly 210 hours using the simple quaternion method if the same degree of energy conservation is desired.

box, while box *shape* variations are allowed in NPTf. The NPTxyz integrator has *not* been shown to sample from the isobaric-isothermal ensemble. It is useful, however, in that it maintains orthogonality for the axes of the simulation box while attempting to equalize pressure along the three perpendicular directions in the box.

Each of the extended system integrators requires additional keywords to set target values for the thermodynamic state variables that are being held constant. Keywords are also required to set the characteristic decay times for the dynamics of the extended variables.

variable	Meta-data instruction	units	default value
$T_{\mathrm{target}}$	<pre>targetTemperature = 300;</pre>	K	none
$P_{\text{target}}$	targetPressure = 1;	atm	none
$ au_T$	<pre>tauThermostat = 1e3;</pre>	fs	none
$ au_B$	tauBarostat = 5e3;	fs	none
	<pre>resetTime = 200;</pre>	fs	none
	<pre>useInitialExtendedSystemState = true;</pre>	logical	true

Two additional keywords can be used to either clear the extended system variables periodically (resetTime), or to maintain the state of the extended system variables between simulations (useInitialExtendedSystemState). More details on these variables and their use in the integrators follows below.

### 4.3 Nosé-Hoover Thermostatting

The Nosé-Hoover equations of motion are given by[50]

$$\dot{\mathbf{r}} = \mathbf{v}, \tag{4.17}$$

$$\dot{\mathbf{v}} = \frac{\mathbf{f}}{m} - \chi \mathbf{v},\tag{4.18}$$

$$\dot{A} = A \cdot \text{skew} \left( \stackrel{\longleftrightarrow}{\mathsf{I}}^{-1} \cdot \mathbf{j} \right), \tag{4.19}$$

$$\dot{\mathbf{j}} = \mathbf{j} \times \left( \overleftrightarrow{\mathsf{I}}^{-1} \cdot \mathbf{j} \right) - \operatorname{rot} \left( \mathsf{A}^T \cdot \frac{\partial V}{\partial \mathsf{A}} \right) - \chi \mathbf{j}. \tag{4.20}$$

 $\chi$  is an "extra" variable included in the extended system, and it is propagated using the first order equation of motion

$$\dot{\chi} = \frac{1}{\tau_T^2} \left( \frac{T}{T_{\text{target}}} - 1 \right). \tag{4.21}$$

The instantaneous temperature T is proportional to the total kinetic energy (both translational and orientational) and is given by

$$T = \frac{2K}{fk_B} \tag{4.22}$$

Here, f is the total number of degrees of freedom in the system,

$$f = 3N + 2N_{\text{linear}} + 3N_{\text{non-linear}} - N_{\text{constraints}}, \tag{4.23}$$

and K is the total kinetic energy,

$$K = \sum_{i=1}^{N} \frac{1}{2} m_i \mathbf{v}_i^T \cdot \mathbf{v}_i + \sum_{i=1}^{N_{\text{linear}} + N_{\text{non-linear}}} \frac{1}{2} \mathbf{j}_i^T \cdot \overrightarrow{\mathbf{l}}_i^{-1} \cdot \mathbf{j}_i.$$
(4.24)

 $N_{\text{linear}}$  is the number of linear rotors (i.e. with two non-zero moments of inertia), and  $N_{\text{non-linear}}$  is the number of non-linear rotors (i.e. with three non-zero moments of inertia).

In eq.(4.21),  $\tau_T$  is the time constant for relaxation of the temperature to the target value. To set values for  $\tau_T$  or  $T_{\rm target}$  in a simulation, one would use the tauThermostat and targetTemperature keywords in the metadata file. The units for tauThermostat are fs, and the units for the targetTemperature are degrees K. The integration of the equations of motion is carried out in a velocity-Verlet style 2 part algorithm:

moveA:

$$T(t) \leftarrow \{\mathbf{v}(t)\}, \{\mathbf{j}(t)\},$$

$$\mathbf{v}(t+h/2) \leftarrow \mathbf{v}(t) + \frac{h}{2} \left(\frac{\mathbf{f}(t)}{m} - \mathbf{v}(t)\chi(t)\right),$$

$$\mathbf{r}(t+h) \leftarrow \mathbf{r}(t) + h\mathbf{v}(t+h/2),$$

$$\mathbf{j}(t+h/2) \leftarrow \mathbf{j}(t) + \frac{h}{2} \left(\tau^b(t) - \mathbf{j}(t)\chi(t)\right),$$

$$A(t+h) \leftarrow \text{rotate} \left(h * \mathbf{j}(t+h/2) \stackrel{\longleftarrow}{\mathsf{I}}^{-1}\right),$$

$$\chi(t+h/2) \leftarrow \chi(t) + \frac{h}{2\tau_T^2} \left(\frac{T(t)}{T_{\text{target}}} - 1\right).$$

Here  $\operatorname{rotate}(h*\mathbf{j}\overset{\frown}{\mathsf{l}}^{-1})$  is the same symplectic Trotter factorization of the three rotation operations that was discussed in the section on the DLM integrator. Note that this operation modifies both the rotation matrix A and the angular momentum  $\mathbf{j}$ . moveA propagates velocities by a half time step, and positional degrees of freedom by a full time step. The new positions (and orientations) are then used to calculate a new set of forces and torques in exactly the same way they are calculated in the doForces portion of the DLM integrator.

Once the forces and torques have been obtained at the new time step, the temperature, velocities, and the extended system variable can be advanced to the same time value.

moveB:

$$\begin{split} &T(t+h) \leftarrow \left\{\mathbf{v}(t+h)\right\}, \left\{\mathbf{j}(t+h)\right\}, \\ &\chi\left(t+h\right) \leftarrow \chi\left(t+h/2\right) + \frac{h}{2\tau_T^2} \left(\frac{T(t+h)}{T_{\text{target}}} - 1\right), \\ &\mathbf{v}\left(t+h\right) \leftarrow \mathbf{v}\left(t+h/2\right) + \frac{h}{2} \left(\frac{\mathbf{f}(t+h)}{m} - \mathbf{v}(t+h)\chi(th)\right), \\ &\mathbf{j}\left(t+h\right) \leftarrow \mathbf{j}\left(t+h/2\right) + \frac{h}{2} \left(\tau^b(t+h) - \mathbf{j}(t+h)\chi(t+h)\right). \end{split}$$

Since  $\mathbf{v}(t+h)$  and  $\mathbf{j}(t+h)$  are required to calculate T(t+h) as well as  $\chi(t+h)$ , they indirectly depend on their own values at time t+h. moveB is therefore done in an iterative fashion until  $\chi(t+h)$  becomes self-consistent. The relative tolerance for the self-consistency check defaults to a value of  $10^{-6}$ , but OPENMD will terminate the iteration after 4 loops even if the consistency check has not been satisfied.

The Nosé-Hoover algorithm is known to conserve a Hamiltonian for the extended system that is, to within a constant, identical to the Helmholtz free energy,[51]

$$H_{\text{NVT}} = V + K + fk_B T_{\text{target}} \left( \frac{\tau_T^2 \chi^2(t)}{2} + \int_0^t \chi(t') dt' \right).$$
 (4.25)

Poor choices of h or  $\tau_T$  can result in non-conservation of  $H_{\rm NVT}$ , so the conserved quantity is maintained in the last column of the .stat file to allow checks on the quality of the integration.

Bond constraints are applied at the end of both the moveA and moveB portions of the algorithm. Details on the constraint algorithms are given in section 4.8.1.

### 4.4 Constant-pressure integration with isotropic box deformations (NPTi)

To carry out isobaric-isothermal ensemble calculations, OPENMD implements the Melchionna modifications to the Nosé-Hoover-Andersen equations of motion.[51] The equations of motion are the same as NVT with the following exceptions:

$$\dot{\mathbf{r}} = \mathbf{v} + \eta \left( \mathbf{r} - \mathbf{R}_0 \right), \tag{4.26}$$

$$\dot{\mathbf{v}} = \frac{\mathbf{f}}{m} - (\eta + \chi)\mathbf{v},\tag{4.27}$$

$$\dot{\eta} = \frac{1}{\tau_B^2 f k_B T_{\text{target}}} V \left( P - P_{\text{target}} \right), \tag{4.28}$$

$$\dot{\mathcal{V}} = 3\mathcal{V}\eta. \tag{4.29}$$

 $\chi$  and  $\eta$  are the "extra" degrees of freedom in the extended system.  $\chi$  is a thermostat, and it has the same function as it does in the Nosé-Hoover NVT integrator.  $\eta$  is a barostat which controls changes to the volume of the simulation box.  $\mathbf{R}_0$  is the location of the center of mass for the entire system, and  $\mathcal{V}$  is the volume of the simulation box. At any time, the volume can be calculated from the determinant of the matrix which describes the box shape:

$$\mathcal{V} = \det(\mathsf{H}). \tag{4.30}$$

The NPTi integrator requires an instantaneous pressure. This quantity is calculated via the pressure tensor,

$$\overrightarrow{\mathsf{P}}(t) = \frac{1}{\mathcal{V}(t)} \left( \sum_{i=1}^{N} m_i \mathbf{v}_i(t) \otimes \mathbf{v}_i(t) \right) + \overrightarrow{\mathsf{W}}(t). \tag{4.31}$$

The kinetic contribution to the pressure tensor utilizes the *outer* product of the velocities, denoted by the  $\otimes$  symbol. The stress tensor is calculated from another outer product of the inter-atomic separation vectors ( $\mathbf{r}_{ij} = \mathbf{r}_j - \mathbf{r}_i$ ) with the forces between the same two atoms,

$$\overrightarrow{\mathbf{W}}(t) = \sum_{i} \sum_{j>i} \mathbf{r}_{ij}(t) \otimes \mathbf{f}_{ij}(t). \tag{4.32}$$

In systems containing cutoff groups, the stress tensor is computed between the centers-of-mass of the cutoff groups:

$$\overleftrightarrow{\mathbf{W}}(t) = \sum_{a} \sum_{b} \mathbf{r}_{ab}(t) \otimes \mathbf{f}_{ab}(t). \tag{4.33}$$

where  $\mathbf{r}_{ab}$  is the distance between the centers of mass, and

$$\mathbf{f}_{ab} = s(r_{ab}) \sum_{i \in a} \sum_{j \in b} \mathbf{f}_{ij} + s'(r_{ab}) \frac{\mathbf{r}_{ab}}{|r_{ab}|} \sum_{i \in a} \sum_{j \in b} V_{ij}(\mathbf{r}_{ij}). \tag{4.34}$$

The instantaneous pressure is then simply obtained from the trace of the pressure tensor,

$$P(t) = \frac{1}{3} \text{Tr} \left( \overrightarrow{P}(t) \right). \tag{4.35}$$

In eq.(4.29),  $\tau_B$  is the time constant for relaxation of the pressure to the target value. To set values for  $\tau_B$  or  $P_{\rm target}$  in a simulation, one would use the tauBarostat and targetPressure keywords in the meta-data file. The units for tauBarostat are fs, and the units for the targetPressure are atmospheres. Like in the NVT integrator, the integration of the equations of motion is carried out in a velocity-Verlet style two part algorithm with only the following differences:

moveA:

$$\begin{split} &P(t) \leftarrow \left\{\mathbf{r}(t)\right\}, \left\{\mathbf{v}(t)\right\}, \\ &\mathbf{v}\left(t+h/2\right) \leftarrow \mathbf{v}(t) + \frac{h}{2}\left(\frac{\mathbf{f}(t)}{m} - \mathbf{v}(t)\left(\chi(t) + \eta(t)\right)\right), \\ &\eta(t+h/2) \leftarrow \eta(t) + \frac{h\mathcal{V}(t)}{2Nk_BT(t)\tau_B^2}\left(P(t) - P_{\text{target}}\right), \\ &\mathbf{r}(t+h) \leftarrow \mathbf{r}(t) + h\left\{\mathbf{v}\left(t+h/2\right) + \eta(t+h/2)\left[\mathbf{r}(t+h) - \mathbf{R}_0\right]\right\}, \\ &\mathbf{H}(t+h) \leftarrow e^{-h\eta(t+h/2)}\mathbf{H}(t). \end{split}$$

The propagation of positions to time t+h depends on the positions at the same time. OPENMD carries out this step iteratively (with a limit of 5 passes through the iterative loop). Also, the simulation box H is scaled uniformly for one full time step by an exponential factor that depends on the value of  $\eta$  at time t+h/2. Reshaping the box uniformly also scales the volume of the box by

$$\mathcal{V}(t+h) \leftarrow e^{-3h\eta(t+h/2)} \times \mathcal{V}(t). \tag{4.36}$$

The doForces step for the NPTi integrator is exactly the same as in both the DLM and NVT integrators. Once the forces and torques have been obtained at the new time step, the velocities can be advanced to the same time value.

moveB:

$$\begin{split} &P(t+h) \leftarrow \left\{\mathbf{r}(t+h)\right\}, \left\{\mathbf{v}(t+h)\right\}, \\ &\eta(t+h) \leftarrow \eta(t+h/2) + \frac{h\mathcal{V}(t+h)}{2Nk_BT(t+h)\tau_B^2} \left(P(t+h) - P_{\text{target}}\right), \\ &\mathbf{v}\left(t+h\right) \leftarrow \mathbf{v}\left(t+h/2\right) + \frac{h}{2} \left(\frac{\mathbf{f}(t+h)}{m} - \mathbf{v}(t+h)(\chi(t+h) + \eta(t+h))\right), \\ &\mathbf{j}\left(t+h\right) \leftarrow \mathbf{j}\left(t+h/2\right) + \frac{h}{2} \left(\tau^b(t+h) - \mathbf{j}(t+h)\chi(t+h)\right). \end{split}$$

Once again, since  $\mathbf{v}(t+h)$  and  $\mathbf{j}(t+h)$  are required to calculate T(t+h), P(t+h),  $\chi(t+h)$ , and  $\eta(t+h)$ , they indirectly depend on their own values at time t+h. moveB is therefore done in an iterative fashion until  $\chi(t+h)$  and  $\eta(t+h)$  become self-consistent. The relative tolerance for the self-consistency check defaults to a value of  $10^{-6}$ , but OPENMD will terminate the iteration after 4 loops even if the consistency check has not been satisfied.

The Melchionna modification of the Nosé-Hoover-Andersen algorithm is known to conserve a Hamiltonian for the extended system that is, to within a constant, identical to the Gibbs free energy,

$$H_{\text{NPTi}} = V + K + fk_B T_{\text{target}} \left( \frac{\tau_T^2 \chi^2(t)}{2} + \int_0^t \chi(t') dt' \right) + P_{\text{target}} \mathcal{V}(t). \tag{4.37}$$

Poor choices of  $\delta t$ ,  $\tau_T$ , or  $\tau_B$  can result in non-conservation of  $H_{\rm NPTi}$ , so the conserved quantity is maintained in the last column of the .stat file to allow checks on the quality of the integration. It is also known that this algorithm

samples the equilibrium distribution for the enthalpy (including contributions for the thermostat and barostat),

$$H_{\text{NPTi}} = V + K + \frac{fk_B T_{\text{target}}}{2} \left( \chi^2 \tau_T^2 + \eta^2 \tau_B^2 \right) + P_{\text{target}} \mathcal{V}(t). \tag{4.38}$$

Bond constraints are applied at the end of both the moveA and moveB portions of the algorithm. Details on the constraint algorithms are given in section 4.8.1.

### 4.5 Constant-pressure integration with a flexible box (NPTf)

There is a relatively simple generalization of the Nosé-Hoover-Andersen method to include changes in the simulation box *shape* as well as in the volume of the box. This method utilizes the full  $3 \times 3$  pressure tensor and introduces a tensor of extended variables  $(\overleftarrow{\eta})$  to control changes to the box shape. The equations of motion for this method differ from those of NPTi as follows:

$$\dot{\mathbf{r}} = \mathbf{v} + \overleftarrow{\eta} \cdot (\mathbf{r} - \mathbf{R}_0), \qquad (4.39)$$

$$\dot{\mathbf{v}} = \frac{\mathbf{f}}{m} - (\overleftarrow{\eta} + \chi \cdot 1)\mathbf{v}, \tag{4.40}$$

$$\stackrel{\cdot}{\eta} = \frac{1}{\tau_B^2 f k_B T_{\text{target}}} V \left( \stackrel{\leftarrow}{\mathsf{P}} - P_{\text{target}} \mathbf{1} \right), \tag{4.41}$$

$$\dot{\mathsf{H}} = \stackrel{\longleftrightarrow}{\eta} \cdot \mathsf{H}.$$
 (4.42)

Here, 1 is the unit matrix and  $\stackrel{\longleftrightarrow}{P}$  is the pressure tensor. Again, the volume,  $\mathcal{V}=\det\mathsf{H}.$  The propagation of the equations of motion is nearly identical to the NPTi integration: moveA:

$$\begin{split} & \stackrel{\longleftarrow}{\mathbf{P}}(t) \leftarrow \left\{\mathbf{r}(t)\right\}, \left\{\mathbf{v}(t)\right\}, \\ & \mathbf{v}\left(t+h/2\right) \leftarrow \mathbf{v}(t) + \frac{h}{2}\left(\frac{\mathbf{f}(t)}{m} - (\chi(t)\mathbf{1} + \stackrel{\longleftarrow}{\eta}(t)) \cdot \mathbf{v}(t)\right), \\ & \stackrel{\longleftarrow}{\eta}(t+h/2) \leftarrow \stackrel{\longleftarrow}{\eta}(t) + \frac{h\mathcal{V}(t)}{2Nk_BT(t)\tau_B^2}\left(\stackrel{\longleftarrow}{\mathbf{P}}(t) - P_{\mathrm{target}}\mathbf{1}\right), \\ & \mathbf{r}(t+h) \leftarrow \mathbf{r}(t) + h\left\{\mathbf{v}\left(t+h/2\right) + \stackrel{\longleftarrow}{\eta}(t+h/2) \cdot [\mathbf{r}(t+h) - \mathbf{R}_0]\right\}, \\ & \mathbf{H}(t+h) \leftarrow \mathbf{H}(t) \cdot e^{-h\stackrel{\longleftarrow}{\eta}(t+h/2)}. \end{split}$$

OPENMD uses a power series expansion truncated at second order for the exponential operation which scales the simulation box.

The moveB portion of the algorithm is largely unchanged from the NPTi integrator: moveB:

$$\begin{aligned} & \stackrel{\longleftarrow}{\mathbf{P}}(t+h) \leftarrow \left\{\mathbf{r}(t+h)\right\}, \left\{\mathbf{v}(t+h)\right\}, \left\{\mathbf{f}(t+h)\right\}, \\ & \stackrel{\longleftarrow}{\boldsymbol{\gamma}}(t+h) \leftarrow \stackrel{\longleftarrow}{\boldsymbol{\gamma}}(t+h/2) + \frac{h\mathcal{V}(t+h)}{2Nk_BT(t+h)\tau_B^2} \left(\stackrel{\longleftarrow}{P}(t+h) - P_{\mathrm{target}}\mathbf{1}\right), \\ & \mathbf{v}(t+h) \leftarrow \mathbf{v}(t+h/2) + \frac{h}{2} \left(\frac{\mathbf{f}(t+h)}{m} - (\chi(t+h)\mathbf{1} + \stackrel{\longleftarrow}{\boldsymbol{\gamma}}(t+h))\right) \cdot \mathbf{v}(t+h), \end{aligned}$$

The iterative schemes for both moveA and moveB are identical to those described for the NPTi integrator.

The NPTf integrator is known to conserve the following Hamiltonian:

$$H_{\text{NPTf}} = V + K + fk_B T_{\text{target}} \left( \frac{\tau_T^2 \chi^2(t)}{2} + \int_0^t \chi(t') dt' \right) + P_{\text{target}} \mathcal{V}(t) + \frac{fk_B T_{\text{target}}}{2} \text{Tr} \left[ \overrightarrow{\eta}(t) \right]^2 \tau_B^2. \tag{4.43}$$

This integrator must be used with care, particularly in liquid simulations. Liquids have very small restoring forces in the off-diagonal directions, and the simulation box can very quickly form elongated and sheared geometries which become smaller than the cutoff radius. The NPTf integrator finds most use in simulating crystals or liquid crystals which assume non-orthorhombic geometries.

### 4.6 Constant pressure in 3 axes (NPTxyz)

There is one additional extended system integrator which is somewhat simpler than the NPTf method described above. In this case, the three axes have independent barostats which each attempt to preserve the target pressure along the box walls perpendicular to that particular axis. The lengths of the box axes are allowed to fluctuate independently, but the angle between the box axes does not change. The equations of motion are identical to those described above, but only the *diagonal* elements of  $\overrightarrow{\eta}$  are computed. The off-diagonal elements are set to zero (even when the pressure tensor has non-zero off-diagonal elements).

It should be noted that the NPTxyz integrator is *not* known to preserve any Hamiltonian of interest to the chemical physics community. The integrator is extremely useful, however, in generating initial conditions for other integration methods. It *is* suitable for use with liquid simulations, or in cases where there is orientational anisotropy in the system (i.e. in lipid bilayer simulations).

## 4.7 Langevin Dynamics (LD)

OPENMD implements a Langevin integrator in order to perform molecular dynamics simulations in implicit solvent environments. This can result in substantial performance gains when the detailed dynamics of the solvent is not important. Since OPENMD also handles rigid bodies of arbitrary composition and shape, the Langevin integrator is by necessity somewhat more complex than in other simulation packages.

Consider the Langevin equations of motion in generalized coordinates

$$\mathbf{M}\dot{\mathbf{V}}(t) = \mathbf{F}_s(t) + \mathbf{F}_f(t) + \mathbf{F}_r(t) \tag{4.44}$$

where  $\mathbf{M}$  is a  $6 \times 6$  diagonal mass matrix (which includes the mass of the rigid body as well as the moments of inertia in the body-fixed frame) and  $\mathbf{V}$  is a generalized velocity,  $\mathbf{V} = \{\mathbf{v}, \omega\}$ . The right side of Eq. 4.44 consists of three generalized forces: a system force ( $\mathbf{F}_s$ ), a frictional or dissipative force ( $\mathbf{F}_f$ ) and a stochastic force ( $\mathbf{F}_r$ ). While the evolution of the system in Newtonian mechanics is typically done in the lab frame, it is convenient to handle the dynamics of rigid bodies in body-fixed frames. Thus the friction and random forces on each substructure are calculated in a body-fixed frame and may converted back to the lab frame using that substructure's rotation matrix ( $\mathbf{Q}$ ):

$$\mathbf{F}_{f,r} = \begin{pmatrix} \mathbf{f}_{f,r} \\ \tau_{f,r} \end{pmatrix} = \begin{pmatrix} \mathbf{Q}^T \mathbf{f}_{f,r}^b \\ \mathbf{Q}^T \tau_{f,r}^b \end{pmatrix}$$
(4.45)

The body-fixed friction force,  $\mathbf{F}_f^b$ , is proportional to the (body-fixed) velocity at the center of resistance  $\mathbf{v}_R^b$  and the

angular velocity  $\omega$ 

$$\mathbf{F}_{f}^{b}(t) = \begin{pmatrix} \mathbf{f}_{f}^{b}(t) \\ \tau_{f}^{b}(t) \end{pmatrix} = -\begin{pmatrix} \Xi_{R}^{tt} & \Xi_{R}^{rt} \\ \Xi_{R}^{tr} & \Xi_{R}^{rr} \end{pmatrix} \begin{pmatrix} \mathbf{v}_{R}^{b}(t) \\ \omega(t) \end{pmatrix}, \tag{4.46}$$

while the random force,  $\mathbf{F}_r$ , is a Gaussian stochastic variable with zero mean and variance,

$$\langle \mathbf{F}_r(t)(\mathbf{F}_r(t'))^T \rangle = \langle \mathbf{F}_r^b(t)(\mathbf{F}_r^b(t'))^T \rangle = 2k_B T \Xi_R \delta(t - t'). \tag{4.47}$$

 $\Xi_R$  is the  $6 \times 6$  resistance tensor at the center of resistance.

For atoms and ellipsoids, there are good approximations for this tensor that are based on Stokes' law. For arbitrary rigid bodies, the resistance tensor must be pre-computed before Langevin dynamics can be used. The OPENMD distribution contains a utitilty program called Hydro that performs this computation.

Once this tensor is known for a given integrableObject, obtaining a stochastic vector that has the properties in Eq. (4.47) can be done efficiently by carrying out a one-time Cholesky decomposition to obtain the square root matrix of the resistance tensor,

$$\Xi_R = \mathbf{S}\mathbf{S}^T,\tag{4.48}$$

where S is a lower triangular matrix.[?] A vector with the statistics required for the random force can then be obtained by multiplying S onto a random 6-vector Z which has elements chosen from a Gaussian distribution, such that:

$$\langle \mathbf{Z}_i \rangle = 0, \qquad \langle \mathbf{Z}_i \cdot \mathbf{Z}_j \rangle = \frac{2k_B T}{\delta t} \delta_{ij}, \qquad (4.49)$$

where  $\delta t$  is the timestep in use during the simulation. The random force,  $\mathbf{F}_r^{\ b} = \mathbf{SZ}$ , can be shown to have the correct properties required by Eq. (4.47).

The equation of motion for the translational velocity of the center of mass (v) can be written as

$$m\dot{\mathbf{v}}(t) = \mathbf{f}_s(t) + \mathbf{f}_f(t) + \mathbf{f}_r(t) \tag{4.50}$$

Since the frictional and random forces are applied at the center of resistance, which generally does not coincide with the center of mass, extra torques are exerted at the center of mass. Thus, the net body-fixed torque at the center of mass,  $\tau^b(t)$ , is given by

$$\tau^{b} \leftarrow \tau_{s}^{b} + \tau_{f}^{b} + \tau_{r}^{b} + \mathbf{r}_{MR} \times \left(\mathbf{f}_{f}^{b} + \mathbf{f}_{r}^{b}\right) \tag{4.51}$$

where  $\mathbf{r}_{MR}$  is the vector from the center of mass to the center of resistance. Instead of integrating the angular velocity in lab-fixed frame, we consider the equation of motion for the angular momentum ( $\mathbf{j}$ ) in the body-fixed frame

$$\frac{\partial}{\partial t}\mathbf{j}(t) = \tau^{b}(t) \tag{4.52}$$

By embedding the friction and random forces into the total force and torque, OPENMD integrates the Langevin equations of motion for a rigid body of arbitrary shape in a velocity-Verlet style 2-part algorithm, where  $h = \delta t$ :

move A:

$$\mathbf{v}\left(t+h/2\right) \leftarrow \mathbf{v}(t) + \frac{h}{2}\left(\mathbf{f}(t)/m\right),$$

$$\mathbf{r}(t+h) \leftarrow \mathbf{r}(t) + h\mathbf{v}\left(t+h/2\right),$$

$$\mathbf{j}\left(t+h/2\right) \leftarrow \mathbf{j}(t) + \frac{h}{2}\tau^{b}(t),$$

$$\mathbf{Q}(t+h) \leftarrow \text{rotate}\left(h\mathbf{j}(t+h/2) \cdot \overrightarrow{\mathsf{I}}^{-1}\right).$$

In this context,  $\overrightarrow{l}$  is the diagonal moment of inertia tensor, and the rotate function is the reversible product of the three body-fixed rotations,

$$rotate(\mathbf{a}) = \mathsf{G}_x(a_x/2) \cdot \mathsf{G}_y(a_y/2) \cdot \mathsf{G}_z(a_z) \cdot \mathsf{G}_y(a_y/2) \cdot \mathsf{G}_x(a_x/2), \tag{4.53}$$

where each rotational propagator,  $G_{\alpha}(\theta)$ , rotates both the rotation matrix (**Q**) and the body-fixed angular momentum (**j**) by an angle  $\theta$  around body-fixed axis  $\alpha$ ,

$$\mathsf{G}_{\alpha}(\theta) = \begin{cases} \mathbf{Q}(t) & \leftarrow & \mathbf{Q}(0) \cdot \mathsf{R}_{\alpha}(\theta)^{T}, \\ \mathbf{j}(t) & \leftarrow & \mathsf{R}_{\alpha}(\theta) \cdot \mathbf{j}(0). \end{cases}$$
(4.54)

 $R_{\alpha}$  is a quadratic approximation to the single-axis rotation matrix. For example, in the small-angle limit, the rotation matrix around the body-fixed x-axis can be approximated as

$$R_{x}(\theta) \approx \begin{pmatrix} 1 & 0 & 0\\ 0 & \frac{1-\theta^{2}/4}{1+\theta^{2}/4} & -\frac{\theta}{1+\theta^{2}/4}\\ 0 & \frac{\theta}{1+\theta^{2}/4} & \frac{1-\theta^{2}/4}{1+\theta^{2}/4} \end{pmatrix}.$$
(4.55)

All other rotations follow in a straightforward manner. After the first part of the propagation, the forces and body-fixed torques are calculated at the new positions and orientations. The system forces and torques are derivatives of the total potential energy function (U) with respect to the rigid body positions  $(\mathbf{r})$  and the columns of the transposed rotation matrix  $\mathbf{Q}^T = (\mathbf{u}_x, \mathbf{u}_y, \mathbf{u}_z)$ :

Forces:

$$\begin{split} \mathbf{f}_s(t+h) &\leftarrow -\left(\frac{\partial U}{\partial \mathbf{r}}\right)_{\mathbf{r}(t+h)} \\ \tau_s(t+h) &\leftarrow \mathbf{u}(t+h) \times \frac{\partial U}{\partial \mathbf{u}} \\ \mathbf{v}_R^b(t+h) &\leftarrow \mathbf{Q}(t+h) \cdot (\mathbf{v}(t+h) + \omega(t+h) \times \mathbf{r}_{MR}) \\ \mathbf{f}_{R,f}^b(t+h) &\leftarrow -\Xi_R^{tt} \cdot \mathbf{v}_R^b(t+h) - \Xi_R^{rt} \cdot \omega(t+h) \\ \tau_{R,f}^b(t+h) &\leftarrow -\Xi_R^{tr} \cdot \mathbf{v}_R^b(t+h) - \Xi_R^{rr} \cdot \omega(t+h) \\ Z &\leftarrow \mathsf{GaussianNormal}(2k_BT/h,6) \\ \mathbf{F}_{R,r}^b(t+h) &\leftarrow \mathbf{S} \cdot Z \\ \mathbf{f}(t+h) &\leftarrow \mathbf{f}_s(t+h) + \mathbf{Q}^T(t+h) \cdot (\mathbf{f}_{R,f}^b + \mathbf{f}_{R,r}^b) \\ \tau(t+h) &\leftarrow \tau_s(t+h) + \mathbf{Q}^T(t+h) \cdot (\tau_{R,f}^b + \tau_{R,r}^b) + \mathbf{r}_{MR} \times (\mathbf{f}_f(t+h) + \mathbf{f}_r(t+h)) \\ \tau^b(t+h) &\leftarrow \mathbf{Q}(t+h) \cdot \tau(t+h) \end{split}$$

Frictional (and random) forces and torques must be computed at the center of resistance, so there are additional steps required to find the body-fixed velocity ( $\mathbf{v}_R^b$ ) at this location. Mapping the frictional and random forces at the center of resistance back to the center of mass also introduces an additional term in the torque one obtains at the center of mass.

Once the forces and torques have been obtained at the new time step, the velocities can be advanced to the same time value.

move B:

$$\mathbf{v}(t+h) \leftarrow \mathbf{v}(t+h/2) + \frac{h}{2}(\mathbf{f}(t+h)/m),$$
$$\mathbf{j}(t+h) \leftarrow \mathbf{j}(t+h/2) + \frac{h}{2}\tau^{b}(t+h).$$

The viscosity of the implicit solvent must be specified using the viscosity keyword in the meta-data file if the Langevin integrator is selected. For simple particles (spheres and ellipsoids), no further parameters are necessary. Since there are no analytic solutions for the resistance tensors for composite rigid bodies, the approximate tensors for these objects must also be specified in order to use Langevin dynamics. The meta-data file must therefore point to another file which contains the information about the hydrodynamic properties of all complex rigid bodies being used during the simulation. The HydroPropFile keyword is used to specify the name of this file. A HydroPropFile should be precalculated using the Hydro program that is included in the OPENMD distribution.

Table 4.1: Meta-data Keywords: Required parameters for the Langevin integrator

keyword	units	use
viscosity	centipoise	Sets the value of viscosity of the implicit solvent
targetTemp	K	Sets the target temperature of the system. This param-
		eter must be specified to use Langevin dynamics.
HydroPropFile	string	Specifies the name of the resistance tensor (usually a
		.diff file) which is precalculated by Hydro. This
		keyworkd is not necessary if the simulation contains
		only simple bodies (spheres and ellipsoids).
beadSize	Å	Sets the diameter of the beads to use when the
		RoughShell model is used to approximate the re-
		sistance tensor.

#### 4.8 Constraint Methods

#### 4.8.1 The RATTLE Method for Bond Constraints

In order to satisfy the constraints of fixed bond lengths within OPENMD, we have implemented the RATTLE algorithm of Andersen.[52] RATTLE is a velocity-Verlet formulation of the SHAKE method[53] for iteratively solving the Lagrange multipliers which maintain the holonomic constraints. Both methods are covered in depth in the literature, [14, 12] and a detailed description of this method would be redundant.

#### 4.8.2 The Z-Constraint Method

A force auto-correlation method based on the fluctuation-dissipation theorem was developed by Roux and Karplus to investigate the dynamics of ions inside ion channels.[54] The time-dependent friction coefficient can be calculated from the deviation of the instantaneous force from its mean value:

$$\xi(z,t) = \langle \delta F(z,t) \delta F(z,0) \rangle / k_B T, \tag{4.56}$$

where

$$\delta F(z,t) = F(z,t) - \langle F(z,t) \rangle. \tag{4.57}$$

If the time-dependent friction decays rapidly, the static friction coefficient can be approximated by

$$\xi_{\text{static}}(z) = \int_0^\infty \langle \delta F(z, t) \delta F(z, 0) \rangle dt. \tag{4.58}$$

This allows the diffusion constant to then be calculated through the Einstein relation:[55]

$$D(z) = \frac{k_B T}{\xi_{\text{static}}(z)} = \frac{(k_B T)^2}{\int_0^\infty \langle \delta F(z, t) \delta F(z, 0) \rangle dt}.$$
 (4.59)

The Z-Constraint method, which fixes the z coordinates of a few "tagged" molecules with respect to the center of the mass of the system is a technique that was proposed to obtain the forces required for the force auto-correlation calculation.[55] However, simply resetting the coordinate will move the center of the mass of the whole system. To avoid this problem, we have developed a new method that is utilized in OPENMD. Instead of resetting the coordinates, we reset the forces of z-constrained molecules and subtract the total constraint forces from the rest of the system after the force calculation at each time step.

After the force calculation, the total force on molecule  $\alpha$  is:

$$G_{\alpha} = \sum_{i} F_{\alpha i},\tag{4.60}$$

where  $F_{\alpha i}$  is the force in the z direction on atom i in z-constrained molecule  $\alpha$ . The forces on the atoms in the z-constrained molecule are then adjusted to remove the total force on molecule  $\alpha$ :

$$F_{\alpha i} = F_{\alpha i} - \frac{m_{\alpha i} G_{\alpha}}{\sum_{i} m_{\alpha i}}.$$
(4.61)

Here,  $m_{\alpha i}$  is the mass of atom i in the z-constrained molecule. After the forces have been adjusted, the velocities must also be modified to subtract out molecule  $\alpha$ 's center-of-mass velocity in the z direction.

$$v_{\alpha i} = v_{\alpha i} - \frac{\sum_{i} m_{\alpha i} v_{\alpha i}}{\sum_{i} m_{\alpha i}},\tag{4.62}$$

where  $v_{\alpha i}$  is the velocity of atom i in the z direction. Lastly, all of the accumulated constraint forces must be subtracted from the rest of the unconstrained system to keep the system center of mass of the entire system from drifting.

$$F_{\beta i} = F_{\beta i} - \frac{m_{\beta i} \sum_{\alpha} G_{\alpha}}{\sum_{\beta} \sum_{i} m_{\beta i}},\tag{4.63}$$

where  $\beta$  denotes all *unconstrained* molecules in the system. Similarly, the velocities of the unconstrained molecules must also be scaled:

$$v_{\beta i} = v_{\beta i} + \sum_{\alpha} \frac{\sum_{i} m_{\alpha i} v_{\alpha i}}{\sum_{i} m_{\alpha i}}.$$
(4.64)

This method will pin down the centers-of-mass of all of the z-constrained molecules, and will also keep the entire system fixed at the original system center-of-mass location.

At the very beginning of the simulation, the molecules may not be at their desired positions. To steer a z-constrained molecule to its specified position, a simple harmonic potential is used:

$$U(t) = \frac{1}{2} k_{\text{Harmonic}} (z(t) - z_{\text{cons}})^2, \tag{4.65}$$

where  $k_{\rm Harmonic}$  is an harmonic force constant, z(t) is the current z coordinate of the center of mass of the constrained molecule, and  $z_{\rm cons}$  is the desired constraint position. The harmonic force operating on the z-constrained molecule at time t can be calculated by

$$F_{z_{\text{Harmonic}}}(t) = -\frac{\partial U(t)}{\partial z(t)} = -k_{\text{Harmonic}}(z(t) - z_{\text{cons}}). \tag{4.66}$$

The user may also specify the use of a constant velocity method (steered molecular dynamics) to move the molecules to their desired initial positions. Based on concepts from atomic force microscopy, SMD has been used to study many processes which occur via rare events on the time scale of a few hundreds of picoseconds. For example,SMD has been used to observe the dissociation of Streptavidin-biotin Complex.[56]

To use of the z-constraint method in an OPENMD simulation, the molecules must be specified using the nZconstraints keyword in the meta-data file. The other parameters for modifying the behavior of the z-constraint method are listed in table 4.2.

Table 4.2: Meta-data Keywords: Z-Constraint Parameters

keyword	units	use	remarks
zconsTime	fs	Sets the frequency at which	
		the .fz file is written	
zconsForcePolicy	string	The strategy for subtract-	Possible strategies are BYMASS and
		ing the z-constraint force	BYNUMBER. The default strategy is
		from the unconstrained	BYMASS
		molecules	
zconsGap	Å	Sets the distance between	Used mainly to move molecules
		two adjacent constraint po-	through a simulation to estimate po-
		sitions	tentials of mean force.
zconsFixtime	fs	Sets the length of time	zconsFixtime must be set if
		the z-constraint molecule	zconsGap is set
		is held fixed	
zconsUsingSMD	logical	Flag for using Steered	Harmonic Forces are used by default
		Molecular Dynamics to	
		move the molecules to	
		the correct constrained	
		positions	

# **Restraints**

Restraints are external potentials that are added to a system to keep particular molecules or collections of particles close to some reference structure. A restraint can be a collective

# Thermodynamic Integration

Thermodynamic integration is an established technique that has been used extensively in the calculation of free energies for condensed phases of materials. [57, 58, 59, 60, 61]. This method uses a sequence of simulations during which the system of interest is converted into a reference system for which the free energy is known analytically  $(A_0)$ . The difference in potential energy between the reference system and the system of interest  $(\Delta V)$  is then integrated in order to determine the free energy difference between the two states:

$$A = A_0 + \int_0^1 \langle \Delta V \rangle_{\lambda} \, d\lambda. \tag{6.1}$$

Here,  $\lambda$  is the parameter that governs the transformation between the reference system and the system of interest. For crystalline phases, an harmonically-restrained (Einstein) crystal is chosen as the reference state, while for liquid phases, the ideal gas is taken as the reference state.

In an Einstein crystal, the molecules are restrained at their ideal lattice locations and orientations. Using harmonic restraints, as applied by Bàez and Clancy, the total potential for this reference crystal ( $V_{\rm EC}$ ) is the sum of all the harmonic restraints,

$$V_{\rm EC} = \sum_{i} \left[ \frac{K_{\rm v}}{2} (r_i - r_i^{\circ})^2 + \frac{K_{\theta}}{2} (\theta_i - \theta_i^{\circ})^2 + \frac{K_{\omega}}{2} (\omega_i - \omega_i^{\circ})^2 \right], \tag{6.2}$$

where  $K_v$ ,  $K_\theta$ , and  $K_\omega$  are the spring constants restraining translational motion and deflection of and rotation around the principle axis of the molecule respectively. The values of  $\theta$  range from 0 to  $\pi$ , while  $\omega$  ranges from  $-\pi$  to  $\pi$ .

The partition function for a molecular crystal restrained in this fashion can be evaluated analytically, and the Helmholtz Free Energy (A) is given by

$$\frac{A}{N} = \frac{E_m}{N} - kT \ln \left(\frac{kT}{h\nu}\right)^3 - kT \ln \left[\pi^{\frac{1}{2}} \left(\frac{8\pi^2 I_{A}kT}{h^2}\right)^{\frac{1}{2}} \left(\frac{8\pi^2 I_{B}kT}{h^2}\right)^{\frac{1}{2}} \left(\frac{8\pi^2 I_{C}kT}{h^2}\right)^{\frac{1}{2}}\right] - kT \ln \left[\frac{kT}{2(\pi K_{\omega} K_{\theta})^{\frac{1}{2}}} \exp\left(-\frac{kT}{2K_{\theta}}\right) \int_{0}^{\left(\frac{kT}{2K_{\theta}}\right)^{\frac{1}{2}}} \exp(t^2) dt\right], \quad (6.3)$$

where  $2\pi\nu=(K_{\rm v}/m)^{1/2}$ , and  $E_m$  is the minimum potential energy of the ideal crystal.[60]

OPENMD can perform the simulations that aid the user in constructing the thermodynamic path from the molecular system to one of the reference systems. To do this, the user sets the value of  $\lambda$  (between 0 & 1) in the meta-data file. If the system of interest is crystalline, OPENMD must be able to find the *reference* configuration of the system in a file called idealCrystal.in in the directory from which the simulation was run. This file is a standard .dump file,

but all information about velocities and angular momenta are discarded when the file is read.

The configuration found in the idealCrystal.in file is used for the reference positions and molecular orientations of the Einstein crystal. To complete the specification of the Einstein crystal, a set of force constants must also be specified; one for displacements of the molecular centers of mass, and two for displacements from the ideal orientations of the molecules.

To construct a thermodynamic integration path, the user would run a sequence of N simulations, each with a different value of lambda between 0 and 1. When useSolidThermInt is set to true in the meta-data file, two additional energy columns are reported in the .stat file for the simulation. The first, vRaw, is the unperturbed energy for the configuration, and the second, vHarm, is the energy of the harmonic (Einstein) system in an identical configuration. The total potential energy of the configuration is a linear combination of vRaw and vHarm weighted by the value of  $\lambda$ .

From a running average of the difference between vRaw and vHarm, the user can obtain the integrand in Eq. (6.1) for fixed value of  $\lambda$ .

There are two additional files with the suffixes <code>.zang0</code> and <code>.zang</code> generated by OPENMD during the first run of a solid thermodynamic integration. These files contain the initial (<code>.zang0</code>) and final (<code>.zang</code>) values of the angular displacement coordinates for each of the molecules. These are particularly useful when chaining a number of simulations (with successive values of  $\lambda$ ) together.

For *liquid* thermodynamic integrations, the reference system is the ideal gas (with a potential exactly equal to 0), so the .stat file contains only the standard columns. The potential energy column contains the potential of the *unperturbed* system (and not the  $\lambda$ -weighted potential. This allows the user to use the potential energy directly as the  $\Delta V$  in the integrand of Eq. (6.1).

Meta-data parameters concerning thermodynamic integrations are given in Table 6.1

Table 6.1: Meta-data Keywords: Thermodynamic Integration Parameters

keyword	units	use		remarks
useSolidThermInt	logical	perform	thermodynamic	default is "false"
		integratio	n to an Einstein	
		crystal?		
useLiquidThermInt	logical	perform	thermodynamic	default is "false"
		integratio	n to an ideal gas?	
thermodynamicInteg	rationLambda	L		
	double	transform	nation parameter	Sets how far along the thermody- namic integration path the simula- tion will be.
thermodynamicIntegi	rationK			
	double			power of $\lambda$ governing shape of integration pathway
thermIntDistSpring(	Const			
	kcal $\text{mol}^{-1}\text{Å}^-$	2		spring constant for translations in
				Einstein crystal
thermIntThetaSpring	gConst			
	kcal mol <sup>-1</sup> rad	-2		spring constant for deflection away
				from z-axis in Einstein crystal
thermIntOmegaSpring	gConst			

Table 6.1: Meta-data Keywords: Thermodynamic Integration Parameters

keyword	units	use	remarks
	kcal mol <sup>-1</sup>	rad <sup>-2</sup>	spring constant for rotation around
			z-axis in Einstein crystal

# **Energy Minimization**

As one of the basic procedures of molecular modeling, energy minimization is used to identify local configurations that are stable points on the potential energy surface. There is a vast literature on energy minimization algorithms have been developed to search for the global energy minimum as well as to find local structures which are stable fixed points on the surface. We have included two simple minimization algorithms: steepest descent, (SD) and conjugate gradient (CG) to help users find reasonable local minima from their initial configurations. Since OPENMD handles atoms and rigid bodies which have orientational coordinates as well as translational coordinates, there is some subtlety to the choice of parameters for minimization algorithms.

Given a coordinate set  $x_k$  and a search direction  $d_k$ , a line search algorithm is performed along  $d_k$  to produce  $x_{k+1} = x_k + \lambda_k d_k$ . In the steepest descent (SD) algorithm,

$$d_k = -\nabla V(x_k). (7.1)$$

The gradient and the direction of next step are always orthogonal. This may cause oscillatory behavior in narrow valleys. To overcome this problem, the Fletcher-Reeves variant [62] of the conjugate gradient (CG) algorithm is used to generate  $d_{k+1}$  via simple recursion:

$$d_{k+1} = -\nabla V(x_{k+1}) + \gamma_k d_k \tag{7.2}$$

where

$$\gamma_k = \frac{\nabla V(x_{k+1})^T \nabla V(x_{k+1})}{\nabla V(x_k)^T \nabla V(x_k)}.$$
(7.3)

The Polak-Ribiere variant [63] of the conjugate gradient  $(\gamma_k)$  is defined as

$$\gamma_k = \frac{[\nabla V(x_{k+1}) - \nabla V(x)]^T \nabla V(x_{k+1})}{\nabla V(x_k)^T \nabla V(x_k)}$$
(7.4)

It is widely agreed that the Polak-Ribiere variant gives better convergence than the Fletcher-Reeves variant, so the conjugate gradient approach implemented in OPENMD is the Polak-Ribiere variant.

The conjugate gradient method assumes that the conformation is close enough to a local minimum that the potential energy surface is very nearly quadratic. When the initial structure is far from the minimum, the steepest descent method can be superior to the conjugate gradient method. Hence, the steepest descent method is often used for the first 10-100 steps of minimization. Another useful feature of minimization methods in OPENMD is that a modified SHAKE algorithm can be applied during the minimization to constraint the bond lengths if this is required by the force field. Meta-data parameters concerning the minimizer are given in Table 7.1

Table 7.1: Meta-data Keywords: Energy Minimizer Parameters

keyword	units	use	remarks
minimizer	string	selects the minimization	either CG (conjugate gradient) or SD
		method to be used	(steepest descent)
minimizerMaxIter	steps	Sets the maximum number	The default value is 200
		of iterations for the energy	
		minimization	
minimizerWriteFreq	steps	Sets the frequency with	
		which the .dump and	
		.stat files are writtern	
		during energy minimiza-	
		tion	
minimizerStepSize	Å	Sets the step size for the	The default value is 0.01
		line search	
minimizerFTol	$kcal mol^{-1}$	Sets the energy tolerance	The default value is $10^{-8}$
		for stopping the minimzia-	
		tion.	
minimizerGTol	kcal mol <sup>-1</sup> Å	Sets the gradient tolerance	The default value is $10^{-8}$
		for stopping the minimiza-	
		tion.	
minimizerLSTol	$kcal mol^{-1}$	Sets line search tolerance	The default value is $10^{-8}$
		for terminating each step of	
		the minimization.	
minimizerLSMaxIter	steps	Sets the maximum number	The default value is 50
		of iterations for each line	
		search	

## **Analysis of Physical Properties**

OPENMD includes a few utility programs which compute properties from the dump files that are generated during a molecular dynamics simulation. These programs are:

**Dump2XYZ** Converts an OPENMD dump file into a file suitable for viewing in a molecular dynamics viewer like Jmol

**StaticProps** Computes static properties like the pair distribution function, g(r).

**DynamicProps** Computes time correlation functions like the velocity autocorrelation function,  $\langle v(t) \cdot v(0) \rangle$ , or the mean square displacement  $\langle |r(t) - r(0)|^2 \rangle$ .

These programs often need to operate on a subset of the data contained within a dump file. For example, if you want only the *oxygen-oxygen* pair distribution from a water simulation, or if you want to make a movie including only the water molecules within a 6 angstrom radius of lipid head groups, you need a way to specify your selection to these utility programs. OPENMD has a selection syntax which allows you to specify the selection in a compact form in order to generate only the data you want. For example a common use of the StaticProps command would be:

```
StaticProps -i tp4.dump --gofr --sele1="select 0*" --sele2="select 0*"
```

This command computes the oxygen-oxygen pair distribution function,  $g_{OO}(r)$ , from a file named tp4. dump. In order to understand this selection syntax and to make full use of the selection capabilities of the analysis programs, it is necessary to understand a few of the core concepts that are used to perform simulations.

### 8.1 Concepts

OPENMD manipulates both traditional atoms as well as some objects that *behave like atoms*. These objects can be rigid collections of atoms or atoms which have orientational degrees of freedom. Here is a diagram of the class heirarchy:

- A **StuntDouble** is *any* object that can be manipulated by the integrators and minimizers.
- An **Atom** is a fundamental point-particle that can be moved around during a simulation.
- A **DirectionalAtom** is an atom which has *orientational* as well as translational degrees of freedom.
- A RigidBody is a collection of Atoms or DirectionalAtoms which behaves as a single unit.

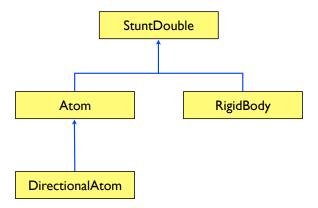


Figure 8.1: The class heirarchy of StuntDoubles in OPENMD-4. The selection syntax allows the user to select any of the objects that are descended from a StuntDouble.

Every Molecule, Atom and DirectionalAtom in OPENMD have their own names which are specified in the .md file. In contrast, RigidBodies are denoted by their membership and index inside a particular molecule: [Molecule-Name]\_RB\_[index] (the contents inside the brackets depend on the specifics of the simulation). The names of rigid bodies are generated automatically. For example, the name of the first rigid body in a DMPC molecule is DMPC\_RB\_0.

### 8.2 Syntax of the Select Command

The most general form of the select command is: select expression

This expression represents an arbitrary set of StuntDoubles (Atoms or RigidBodies) in OPENMD. Expressions are composed of either name expressions, index expressions, predefined sets, user-defined expressions, comparison operators, within expressions, or logical combinations of the above expression types. Expressions can be combined using parentheses and the Boolean operators.

#### 8.2.1 Logical expressions

The logical operators allow complex queries to be constructed out of simpler ones using the standard boolean connectives **and**, **or**, **not**. Parentheses can be used to alter the precedence of the operators.

logical operator	equivalent operator
and	"&", "&&"
or	" ", "  ", ";"
not	"!"

#### 8.2.2 Name expressions

type of expression	examples	translation of examples
expression without "."	select DMPC	select all StuntDoubles belonging to all DMPC
		molecules
	select C*	select all atoms which have atom types beginning with
		C
	select DMPC_RB_*	select all RigidBodies in DMPC molecules (but only
		select the rigid bodies, and not the atoms belonging to
		them).
expression has one "."	select TIP3P.O_TIP3P	select the O_TIP3P atoms belonging to TIP3P
		molecules
	select DMPC_RB_O.PO4	select the PO4 atoms belonging to the first RigidBody
		in each DMPC molecule
	select DMPC.20	select the twentieth StuntDouble in each DMPC
		molecule
expression has two "."s	select DMPC.DMPC_RB_?.*	select all atoms belonging to all rigid bodies within all
		DMPC molecules

### 8.2.3 Index expressions

examples	translation of examples
select 20	select all of the StuntDoubles belonging to Molecule 20
select 20 to 30	select all of the StuntDoubles belonging to molecules which have global
	indices between 20 (inclusive) and 30 (exclusive)

#### 8.2.4 Predefined sets

keyword	description
all	select all StuntDoubles
none	select none of the StuntDoubles

### 8.2.5 User-defined expressions

Users can define arbitrary terms to represent groups of StuntDoubles, and then use the define terms in select commands. The general form for the define command is: **define** *term expression* 

Once defined, the user can specify such terms in boolean expressions

```
define SSDWATER SSD or SSD1 or SSDRF select SSDWATER
```

#### **8.2.6** Comparison expressions

StuntDoubles can be selected by using comparision operators on their properties. The general form for the comparison command is: a property name, followed by a comparision operator and then a number.

property	mass, charge
comparison operator	">", "<", "=", ">=", "<=", "! ="

For example, the phrase select mass > 16.0 and charge < -2 wouldselect StuntDoubles which have mass greater than 16.0 and charges less than -2.

#### **8.2.7** Within expressions

The "within" keyword allows the user to select all StuntDoubles within the specified distance (in Angstroms) from a selection, including the selected atom itself. The general form for within selection is: select within (distance, expression)

For example, the phrase select within (2.5, PO4 or NC4) would select all StuntDoubles which are within 2.5 angstroms of PO4 or NC4 atoms.

#### 8.3 Tools which use the selection command

#### 8.3.1 Dump2XYZ

Dump2XYZ can transform an OPENMD dump file into a xyz file which can be opened by other molecular dynamics viewers such as Jmol and VMD. The options available for Dump2XYZ are as follows:

Table 8.1: Dump2XYZ Command-line Options

option	verbose option	behavior
-h	help	Print help and exit
-V	version	Print version and exit
-i	input=filename	input dump file
-0	output=filename	output file name
-n	frame=INT	print every n frame (default='1')
-w	water	skip the the waters (default=off)
-m	periodicBox	map to the periodic box (default=off)
-z	zconstraint	replace the atom types of zconstraint molecules (de-
		fault=off)
-r	rigidbody	add a pseudo COM atom to rigidbody (default=off)
-t	watertype	replace the atom type of water model (default=on)
-b	basetype	using base atom type (default=off)
	repeatX=INT	The number of images to repeat in the x direction (de-
		fault='0')
	repeatY=INT	The number of images to repeat in the y direction (de-
		fault='0')
	repeatZ=INT	The number of images to repeat in the z direction (de-
		fault='0')
-s	selection=selection	By specifyingselection="selection command"
	script	with Dump2XYZ, the user can select an arbitrary set
		of StuntDoubles to be converted.
	originsele	By specifyingoriginsele="selection com-
		mand" with Dump2XYZ, the user can re-center the
		origin of the system around a specific StuntDouble

Table 8.1: Dump2XYZ Command-line Options

option	verbose option	behavior
	refsele	In order to rotate the system,originsele and
		refsele must be given to define the new coor-
		dinate set. A StuntDouble which contains a dipole
		(the direction of the dipole is always (0, 0, 1) in body
		frame) is specified by $$ originsele. The new x-z
		plane is defined by the direction of the dipole and the
		StuntDouble is specified byrefsele.

#### 8.3.2 StaticProps

StaticProps can compute properties which are averaged over some or all of the configurations that are contained within a dump file. The most common example of a static property that can be computed is the pair distribution function between atoms of type A and other atoms of type B,  $g_{AB}(r)$ . StaticProps can also be used to compute the density distributions of other molecules in a reference frame fixed to the body-fixed reference frame of a selected atom or rigid body.

There are five seperate radial distribution functions available in OPENMD. Since every radial distribution function involve the calculation between pairs of bodies, --sele1 and --sele2 must be specified to tell StaticProps which bodies to include in the calculation.

--gofr Computes the pair distribution function,

$$g_{AB}(r) = \frac{1}{\rho_B} \frac{1}{N_A} \langle \sum_{i \in A} \sum_{j \in B} \delta(r - r_{ij}) \rangle$$

--r\_theta Computes the angle-dependent pair distribution function. The angle is defined by the intermolecular vector  $\vec{r}$  and z-axis of DirectionalAtom A,

$$g_{AB}(r,\cos\theta) = \frac{1}{\rho_B} \frac{1}{N_A} \langle \sum_{i \in A} \sum_{j \in B} \delta(r - r_{ij}) \delta(\cos\theta_{ij} - \cos\theta) \rangle$$

--r\_omega Computes the angle-dependent pair distribution function. The angle is defined by the z-axes of the two DirectionalAtoms A and B.

$$g_{AB}(r,\cos\omega) = \frac{1}{\rho_B} \frac{1}{N_A} \langle \sum_{i \in A} \sum_{j \in B} \delta(r - r_{ij}) \delta(\cos\omega_{ij} - \cos\omega) \rangle$$

--theta\_omega Computes the pair distribution in the angular space  $\theta, \omega$  defined by the two angles mentioned above.

$$g_{AB}(\cos\theta,\cos\omega) = \frac{1}{\rho_B} \frac{1}{N_A} \langle \sum_{i \in A} \sum_{j \in B} \langle \delta(\cos\theta_{ij} - \cos\theta) \delta(\cos\omega_{ij} - \cos\omega) \rangle$$

--gxyz Calculates the density distribution of particles of type B in the body frame of particle A. Therefore, --originsele and --refsele must be given to define A's internal coordinate set as the reference frame for the calculation.

The vectors (and angles) associated with these angular pair distribution functions are most easily seen in the figure below:

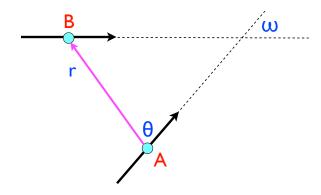


Figure 8.2: Any two directional objects (DirectionalAtoms and RigidBodies) have a set of two angles  $(\theta, \text{ and } \omega)$  between the z-axes of their body-fixed frames.

The options available for  ${\tt StaticProps}$  are as follows:

Table 8.2: StaticProps Command-line Options

option	verbose option	behavior
-h	help	Print help and exit
-V	version	Print version and exit
-i	input=filename	input dump file
-о	output=filename	output file name
-n	step=INT	process every n frame (default='1')
-r	nrbins=INT	number of bins for distance (default='100')
-a	nanglebins=INT	number of bins for cos(angle) (default= '50')
-1	length=DOUBLE	maximum length (Defaults to 1/2 smallest length of
		first frame)
	sele1=selection script	select the first StuntDouble set
	sele2=selection script	select the second StuntDouble set
	sele3=selection script	select the third StuntDouble set
	refsele=selection script	select reference (can only be used withgxyz)
	molname=STRING	molecule name
	begin=INT	begin internal index
	end=INT	end internal index
One option	on from the following group of options is rec	quired:
	gofr	g(r)
	r_theta	$g(r,\cos( heta))$
	r_omega	$g(r,\cos(\omega))$
	theta_omega	$g(\cos(\theta),\cos(\omega))$
	gxyz	g(x,y,z)
	p2	$P_2$ order parameter (sele1 andsele2 must be
		specified)
	scd	$S_{CD}$ order parameter(eithersele1,sele2,
		sele3 are specified ormolname,begin,
		end are specified)

Table 8.2: StaticProps Command-line Options

option	verbose option	behavior
	density	density plot (sele1 must be specified)
	slab_density	slab density (sele1 must be specified)

#### 8.3.3 DynamicProps

DynamicProps computes time correlation functions from the configurations stored in a dump file. Typical examples of time correlation functions are the mean square displacement and the velocity autocorrelation functions. Once again, the selection syntax can be used to specify the StuntDoubles that will be used for the calculation. A general time correlation function can be thought of as:

$$C_{AB}(t) = \langle \vec{u}_A(t) \cdot \vec{v}_B(0) \rangle \tag{8.1}$$

where  $\vec{u}_A(t)$  is a vector property associated with an atom of type A at time t, and  $\vec{v}_B(t')$  is a different vector property associated with an atom of type B at a different time t'. In most autocorrelation functions, the vector properties ( $\vec{v}$  and  $\vec{u}$ ) and the types of atoms (A and B) are identical, and the three calculations built in to DynamicProps make these assumptions. It is possible, however, to make simple modifications to the DynamicProps code to allow the use of cross time correlation functions (i.e. with different vectors). The ability to use two selection scripts to select different types of atoms is already present in the code.

The options available for DynamicProps are as follows:

Table 8.3: DynamicProps Command-line Options

option	verbose option	behavior
-h	help	Print help and exit
-V	version	Print version and exit
-i	input=filename	input dump file
-0	output=filename	output file name
	sele1=selection script	select first StuntDouble set
	sele2=selection script	select second StuntDouble set (if sele2 is not set, use
		script from sele1)
One optio	on from the following group of options is rec	uired:
-r	rcorr	compute mean square displacement
-v	vcorr	compute velocity correlation function
-d	dcorr	compute dipole correlation function

# **Preparing Input Configurations**

OPENMD version 4 comes with a few utility programs to aid in setting up initial configuration and meta-data files. Usually, a user is interested in either importing a structure from some other format (usually XYZ or PDB), or in building an initial configuration in some perfect crystalline lattice. The programs bundled with OPENMD which import coordinate files are atom2md, xyz2md, and pdb2md. The programs which generate perfect crystals are called SimpleBuilder and RandomBuilder

### 9.1 atom2md, xyz2md, and pdb2md

atom2md, xyz2md, and pdb2md attempt to construct .md files from a single file containing only atomic coordinate information. To do this task, they make reasonable guesses about bonding from the distance between atoms in the coordinate, and attempt to identify other terms in the potential energy from the topology of the graph of discovered bonds. This procedure is not perfect, and the user should check the discovered bonding topology that is contained in the <MetaData> block in the file that is generated.

Typically, the user would run:

```
atom2md <input spec> [Options]
```

Here <input spec> can be used to specify the type of file being used for configuration input. I.e. using -ipdb specifies that the input file contains coordinate information in the PDB format.

The options available for atom2md are as follows:

Table 9.1: atom2md Command-line Options

option	behavior	
-f #	Start import at molecule # specified	
-1 #	End import at molecule # specified	
-t	All input files describe a single molecule	
-е	Continue with next object after error, if possible	
-z	Compress the output with gzip	
-H	Outputs this help text	
-Hxxx	(xxx is file format ID e.gHpdb) gives format info	
-Hall	Outputs details of all formats	
-V	Outputs version number	
The following file formats are recognized:		

Table 9.1: atom2md Command-line Options

option	behavior	
ent	Protein Data Bank format	
in	OPENMD cartesian coordinates format	
pdb	Protein Data Bank format	
prep	Amber Prep format	
xyz	XYZ cartesian coordinates format	
More specific info and options are available using -H <format-type>, e.gHpdb</format-type>		

The specific programs xyz2md and pdb2md are identical to atom2md, but they use a specific input format and do not expect the the input specifier on the command line.

### 9.2 SimpleBuilder

SimpleBuilder creates simple lattice structures. It requires an initial, but skeletal OPENMD file to specify the components that are to be placed on the lattice. The total number of placed molecules will be shown at the top of the configuration file that is generated, and that number may not match the original meta-data file, so a new meta-data file is also generated which matches the lattice structure.

The options available for SimpleBuilder are as follows:

Table 9.2: SimpleBuilder Command-line Options

option	verbose option	behavior
-h	help	Print help and exit
-V	version	Print version and exit
-0	output=STRING	Output file name
	density=DOUBLE	density (g $\rm cm^{-3}$ )
	nx=INT	number of unit cells in x
	ny=INT	number of unit cells in y
	nz=INT	number of unit cells in z

## 9.3 Hydro

Hydro generates resistance tensor (.diff) files which are required when using the Langevin integrator using complex rigid bodies. Hydro supports two approximate models: the BeadModel and RoughShell. Additionally, Hydro can generate resistance tensor files using analytic solutions for simple shapes. To generate a .diff file, a metadata file is needed as the input file. Since the resistance tensor depends on these quantities, the viscosity of the solvent and the temperature (targetTemp) of the system must be defined in meta-data file. If the approximate model in use is the RoughShell model the beadSize (the diameter of the small beads used to approximate the surface of the body) must also be specified.

The options available for Hydro are as follows:

Table 9.3: Hydro Command-line Options

option	verbose option	behavior
-h	help	Print help and exit
-V	version	Print version and exit
-i	input=filename	input MetaData (md) file
-0	output=STRING	Output file name
	model=STRING	hydrodynamics model (supports both RoughShell
		<pre>and BeadModel)</pre>
-b	beads	generate the beads only, hydrodynamic calculations
		will not be performed (default=off)

# **Parallel Simulation Implementation**

Although processor power is continually improving, it is still unreasonable to simulate systems of more than 10,000 atoms on a single processor. To facilitate study of larger system sizes or smaller systems for longer time scales, parallel methods were developed to allow multiple CPU's to share the simulation workload. Three general categories of parallel decomposition methods have been developed: these are the atomic,[64] spatial [65] and force [8] decomposition methods.

Algorithmically simplest of the three methods is atomic decomposition, where N particles in a simulation are split among P processors for the duration of the simulation. Computational cost scales as an optimal  $\mathcal{O}(N/P)$  for atomic decomposition. Unfortunately, all processors must communicate positions and forces with all other processors at every force evaluation, leading the communication costs to scale as an unfavorable  $\mathcal{O}(N)$ , independent of the number of processors. This communication bottleneck led to the development of spatial and force decomposition methods, in which communication among processors scales much more favorably. Spatial or domain decomposition divides the physical spatial domain into 3D boxes in which each processor is responsible for calculation of forces and positions of particles located in its box. Particles are reassigned to different processors as they move through simulation space. To calculate forces on a given particle, a processor must simply know the positions of particles within some cutoff radius located on nearby processors rather than the positions of particles on all processors. Both communication between processors and computation scale as  $\mathcal{O}(N/P)$  in the spatial method. However, spatial decomposition adds algorithmic complexity to the simulation code and is not very efficient for small N, since the overall communication scales as the surface to volume ratio  $\mathcal{O}(N/P)^{2/3}$  in three dimensions.

The parallelization method used in OPENMD is the force decomposition method.[66] Force decomposition assigns particles to processors based on a block decomposition of the force matrix. Processors are split into an optimally square grid forming row and column processor groups. Forces are calculated on particles in a given row by particles located in that processor's column assignment. One deviation from the algorithm described by Hendrickson *et al.* is the use of column ordering based on the row indexes preventing the need for a transpose operation necessitating a second communication step when gathering the final force components. Force decomposition is less complex to implement than the spatial method but still scales computationally as  $\mathcal{O}(N/P)$  and scales as  $\mathcal{O}(N/\sqrt{P})$  in communication cost. Plimpton has also found that force decompositions scale more favorably than spatial decompositions for systems up to 10,000 atoms and favorably compete with spatial methods up to 100,000 atoms.[65]

## **Conclusion**

We have presented a new parallel simulation program called OPENMD. This program offers some novel capabilities, but mostly makes available a library of modern object-oriented code for the scientific community to use freely. Notably, OPENMD can handle symplectic integration of objects (atoms and rigid bodies) which have orientational degrees of freedom. It can also work with transition metal force fields and point-dipoles. It is capable of scaling across multiple processors through the use of force based decomposition. It also implements several advanced integrators allowing the end user control over temperature and pressure. In addition, it is capable of integrating constrained dynamics through both the RATTLE algorithm and the *z*-constraint method.

We encourage other researchers to download and apply this program to their own research problems. By making the code available, we hope to encourage other researchers to contribute their own code and make it a more powerful package for everyone in the molecular dynamics community to use. All source code for OPENMD is available for download at http://openmd.net.

# Acknowledgments

Development of OPENMD was funded by a New Faculty Award from the Camille and Henry Dreyfus Foundation and by the National Science Foundation under grant CHE-0134881. Computation time was provided by the Notre Dame Bunch-of-Boxes (B.o.B) computer cluster under NSF grant DMR-0079647.

## **Bibliography**

- [1] B. R. Brooks, R. E. Bruccoleri, B. D. Olafson, D. J. States, S. Swaminathan, and M. Karplus, *J. Comp. Chem.*, 4, 187–217 (1983).
- [2] A. D. MacKerell, Jr., B. Brooks, C. L. Brooks III, L. Nilsson, B. Roux, Y. Won, and M. Karplus In *The Encyclopedia of Computational Chemistry*, P. v. R. Schleyer, *et al.*, Ed., Vol. 1; John Wiley & Sons, New York, 1998; pages 271–277.
- [3] D. A. Pearlman, D. A. Case, J. W. Caldwell, W. S. Ross, T. E. Cheatham III, S. DeBolt, D. Ferguson, G. Seibel, and P. Kollman, *Comp. Phys. Comm.*, **91**, 1–41 (1995).
- [4] H. J. C. Berendsen, D. van der Spoel, and R. van Drunen, *Comp. Phys. Comm.*, **91**, 43–56 (1995).
- [5] E. Lindahl, B. Hess, and D. van der Spoel, J. Mol. Modelling, 7, 306–317 (2001).
- [6] W. Smith and T. Forester, J. Mol. Graphics, 14(3), 136–141 (1996).
- [7] J. W. Ponder and F. M. Richards, J. Comp. Chem., 8(7), 1016–1024 (1987).
- [8] S. J. Plimpton and B. A. Hendrickson In J. Broughton, P. Bristowe, and J. Newsam, Eds., *Materials Theory and Modelling*, Vol. 291 of *MRS Proceedings*, page 37, Pittsburgh, PA, 1993. Materials Research Society.
- [9] L. Kalé, R. Skeel, M. Bhandarkar, R. Brunner, A. Gursoy, N. Krawetz, J. Phillips, A. Shinozaki, K. Varadarajan, and K. Schulten, *J. Comp. Phys.*, **151**, 283–312 (1999).
- [10] F. Mohamadi, N. G. J. Richards, W. C. Guida, R. Liskamp, M. Lipton, C. Caufield, G. Chang, T. Hendrickson, and W. C. Still, *J. Comp. Chem.*, **11**, 440 (1990).
- [11] H. Goldstein, C. Poole, and J. Safko, Classical Mechanics, Addison Wesley, San Francisco, 3rd ed., 2001.
- [12] M. P. Allen and D. J. Tildesley, Computer Simulations of Liquids, Oxford University Press, New York, 1987.
- [13] D. J. Evans, Mol. Phys., **34**, 317–325 (1977).
- [14] A. Leach, *Molecular Modeling: Principles and Applications*, Pearson Educated Limited, Harlow, England, 2nd ed., 2001.
- [15] G. Cevc and D. Marsh, *Phospholipid Bilayers*, John Wiley & Sons, New York, 1987.
- [16] C. J. Fennell and J. D. Gezelter, *J. Chem. Phys.*, **120**(19), 9175–9184 (2004).
- [17] Y. Liu and T. Ichiye, J. Phys. Chem., 100, 2723–2730 (1996).
- [18] M. Martin and J. I. Siepmann, J. Phys. Chem. B, **102**, 2569–2577 (1998).

- [19] D. Bratko, L. Blum, and A. Luzar, J. Chem. Phys., 83(12), 6367–6370 (1985).
- [20] L. Blum, F. Vericat, and D. Bratko, J. Chem. Phys., 102(3), 1461–1462 (1995).
- [21] Y. Liu and T. Ichiye, Chem. Phys. Lett., 256, 334–340 (1996).
- [22] A. Chandra and T. Ichiye, J. Chem. Phys., 111(6), 2701–2709 (1999).
- [23] M.-L. Tan, J. T. Fischer, A. Chandra, B. R. Brooks, and T. Ichiye, Chem. Phys. Lett., 376, 646–652 (2003).
- [24] G. Hura, J. M. Sorenson, R. M. Glaeser, and T. Head-Gordon, J. Chem. Phys., 113, 9140–9148 (2000).
- [25] S. J. Marrink, E. Lindahl, O. Edholm, and A. E. Mark, J. Am. Chem. Soc., 123, 8638–8639 (2001).
- [26] H. J. C. Berendsen, J. P. M. Postma, W. F. van Gunsteren, and J. Hermans In *Intermolecular Forces*, B. Pullman, Ed.; Reidel, Dordrecht, 1981; page 331.
- [27] H. J. C. Berendsen, J. R. Grigera, and T. P. Straatsma, J. Phys. Chem., 91, 6269-6271 (1987).
- [28] W. L. Jorgensen, J. Chandrasekhar, J. D. Madura, R. W. Impey, and M. L. Klein, *J. Chem. Phys.*, **79**, 926–935 (1983).
- [29] M. W. Mahoney and W. L. Jorgensen, J. Chem. Phys., 112(20), 8910–8922 (2000).
- [30] M. W. Finnis and J. E. Sinclair, *Phil. Mag. A*, **50**, 45–55 (1984).
- [31] F. Ercolessi, M. Parrinello, and E. Tosatti, *Phil. Mag. A*, **58**, 213–226 (1988).
- [32] A. P. Sutton and J. Chen, *Phil. Mag. Lett.*, **61**, 139–146 (1990).
- [33] Y. Qi, T. Çağin, Y. Kimura, and W. A. Goddard III, Phys. Rev. B, 59(5), 3527–3533 (1999).
- [34] U. Tartaglino, E. Tosatti, D. Passerone, and F. Ercolessi, Phys. Rev. B, 65, 241406 (2002).
- [35] M. S. Daw and M. I. Baskes, *Phys. Rev. B*, **29**(12), 6443–6453 (1984).
- [36] S. M. Foiles, M. I. Baskes, and M. S. Daw, *Phys. Rev. B*, **33**(12), 7983 (1986).
- [37] R. A. Johnson, *Phys. Rev. B*, **39**(17), 12554 (1989).
- [38] J. Lu and J. A. Szpunar, *Phil. Mag. A*, **75**, 1057–1066 (1997).
- [39] A. Voter, Intermetallic Compounds: Principles and Practice, 1, 77 (1995).
- [40] M. S. Daw, Phys. Rev. B, 39, 7441–7452 (1989).
- [41] A. Voter and S. Chen, Mat. Res. Soc. Symp. Proc., 82, 175 (1987).
- [42] R. T. Cygan, J.-J. Liang, and A. G. Kalinichev, J. Phys. Chem. B, 108, 1255–1266 (2004).
- [43] D. Wolf, P. Keblinski, S. R. Phillpot, and J. Eggebrecht, J. Chem. Phys., 110(17), 8254–8282 (1999).
- [44] R. E. Jones and D. H. Templeton, J. Chem. Phys., 25(5), 1062–1063 (1956).
- [45] D. M. Heyes, J. Chem. Phys., **74**(3), 1924–1929 (1981).
- [46] C. J. Fennell and J. D. Gezelter, J. Chem. Phys., 124(23), 234104(12) (2006).

- [47] A. Dullweber, B. Leimkuhler, and R. McLachlan, J. Chem. Phys., 107(15), 5840–5851 (1997).
- [48] D. Frenkel and B. Smit, *Understanding Molecular Simulation: From Algorithms to Applications*, Academic Press, New York, 1996.
- [49] A. Kol, B. B. Laird, and B. J. Leimkuhler, J. Chem. Phys., 107(7), 2580–2588 (1997).
- [50] W. G. Hoover, *Phys. Rev. A*, **31**, 1695 (1985).
- [51] S. Melchionna, G. Ciccotti, and B. L. Holian, Mol. Phys., 78, 533–544 (1993).
- [52] H. C. Andersen, J. Comp. Phys., **52**, 24–34 (1983).
- [53] J. P. Ryckaert, G. Ciccotti, and H. J. C. Berendsen, J. Comp. Phys., 23, 327–341 (1977).
- [54] B. Roux and M. Karplus, J. Phys. Chem., 95(15), 4856–4868 (1991).
- [55] S. J. Marrink and H. J. C. Berendsen, J. Phys. Chem., 98(15), 4155–4168 (1994).
- [56] H. Grubmuller, B. Heymann, and P. Tavan, Science, 271, 997–999 (1996).
- [57] D. Frenkel and A. J. C. Ladd, J. Chem. Phys., 81(7), 3188–3193 (1984).
- [58] J. Hermans, A. Pathiaseril, and A. Anderson, J. Am. Chem. Soc., 110, 5982–5986 (1988).
- [59] E. J. Meijer, D. Frenkel, R. A. LeSar, and A. J. C. Ladd, J. Chem. Phys., 92(12), 7570–7575 (1990).
- [60] L. A. Bàez and P. Clancy, Mol. Phys., 86(3), 385–396 (1995).
- [61] M. J. Vlot, J. Huinink, and J. P. van der Eerden, J. Chem. Phys., 110(1), 55–61 (1999).
- [62] R. Fletcher and C. M. Reeves, Comput. J., 7(2), 149–154 (1964).
- [63] E. Polak and G. Ribiere, Rev. Fr. Inform. Rech. Oper., 16-R1, 35-43 (1969).
- [64] G. C. Fox, M. A. Johnson, G. A. Lyzenga, S. W. Otto, J. K. Salmon, and D. W. Walker, *Solving Promblems on Concurrent Processors*, Vol. I, Prentice-Hall, Englewood Cliffs, NJ, 1988.
- [65] S. Plimpton, J. Comp. Phys., 117, 1-19 (1995).
- [66] B. Hendrickson and S. Plimpton, Journal of Parallel and Distributed Computing, 27, 15–25 (1995).