

# Mango-Selm Software: Fluid-Structure Interaction subject to Thermal Fluctuations Soft Materials, Biophysics, Fluidics

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DE-SC0019246



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DMS-0956210

# Tips for SELM Package: Installation and Usage

## Instructions

**Pre-compiled binaries:** for (Debian 9+/Ubuntu and Centos 7+, Python 3.6+).

### Quick start:

```
>> pip install selm-lammps  
test: >> python -c "from selm_lammps.tests import t1; t1.test()"
```

Alternatively, can use *docker run -it ubuntu:20.04 /bin/bash; (use python3)*.

**Examples, docs, source:** see <http://mango-selm.org/>

### Directories:

- src/USER-SELM: main C/C++ interface codes for SELM package
- examples/USER/selm: example models and simulation scripts
- lib/selm: library of SELM integrators and related algorithms

### Installing Python components (uses lammps.py, lammps.so):

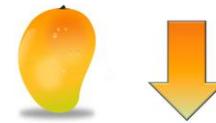
- Recommended to use *conda* or *virtualenv* with python >=3.6
- Examples for Jupyter notebooks, python scripts, for running simulations.
- See README files for more details.

### Jupyter Notebooks and Python-based Simulations:

- Uses python-interfaces to LAMMPs.
- L.command(cmd\_str); runs the command in cmd\_str.
- Model building using python wrapper
  - sets up particles
  - sets up interactions, many possible types and potential available
  - sets up the simulation parameters.

Mango-Selm | Fluctuating H

Home Downloads Screenshots Gallery Documentation



### Downloads

Please join our [mailing list](#) for the announcement of updated releases.

- Download Latest Release

Download: <http://mango-selm.org/>

### Python and Jupyter notebook interfaces



```
In [*]: # We can send collection of commands using the triple quote notation
s = """
# == Run the simulation
run    10000 upto

# == Write restart data
write_restart ${basefilename}.LAMMPS_restart_data
"""

# Feed commands to LAMMPS one line at a time
print_log("Sending commands to LAMMPS");
for line in s.splitlines():
    print_log(line);
    L.command(line);

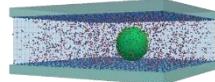
Sending commands to LAMMPS

# == Run the simulation
run    10000 upto
```

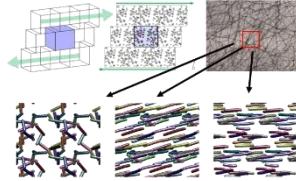
# Mango-Selm Software: Overview



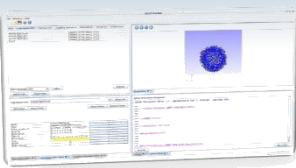
Colloid electrophoresis in a channel.



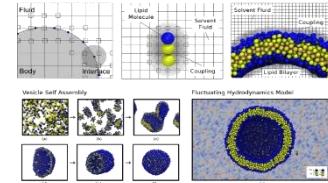
Polymeric fluid subject to shear.



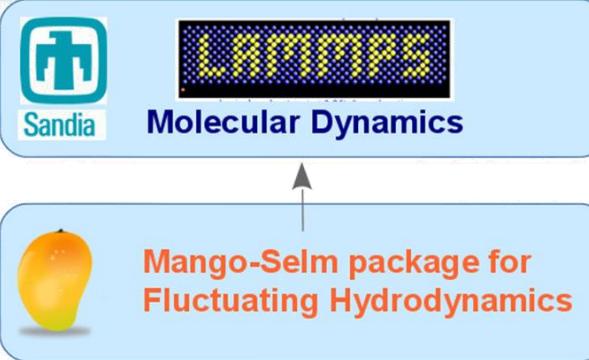
Graphical modeling interface.



Implicit-Solvent Lipid Model: SELM thermostat: self-assembly.



## Molecular dynamics Integration



Download: <http://mango-selm.org/>

## Selm - Simulation Package:

SELM fluctuating hydrodynamics for fluid-structure interactions subject to thermal fluctuations.

- Python, Jupyter notebooks, and other scripting for model building and simulation.
- Stochastic numerical time-step integrators for inertial and quasi-steady physical regimes in (C/C++).

## Molecular dynamics integration with LAMMPS

- Modeling, interactions, many potentials, statistical analysis.
- Thermostats and many ensembles possible such as Lees-Edwards for shear simulations.

## Standardized formats

- XML for parametrization and data output.
- VTK output for continuum fields and microstructures (visualization / analysis).

## Mango – GUI for Model Building:

Graphical User Interface (GUI) for setting up model geometry and simulation parameters.

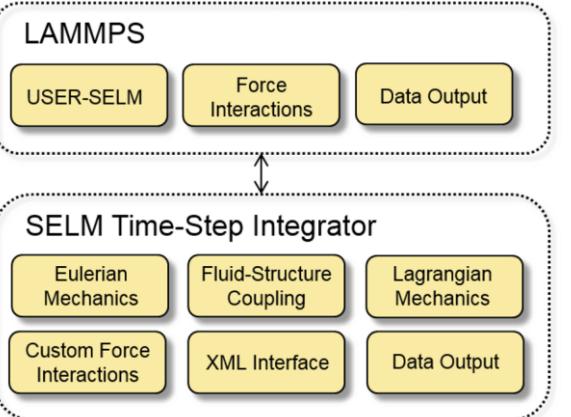
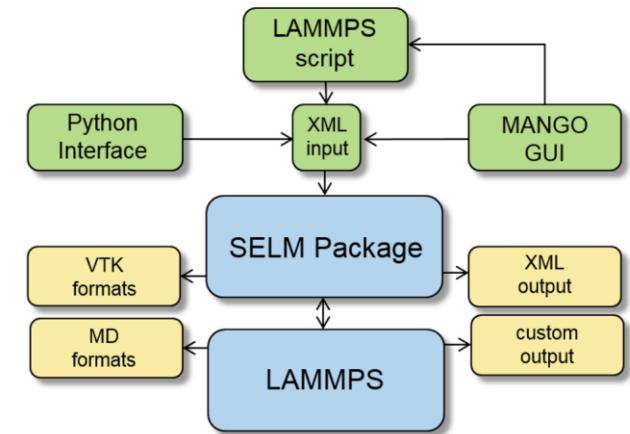
- Generates scripts and data files for SELM fluctuating hydrodynamics simulations.

Extendible object-oriented architectures for inclusion of new numerical methods.

## Python and Jupyter notebook interfaces



## Modular Design and Extendible

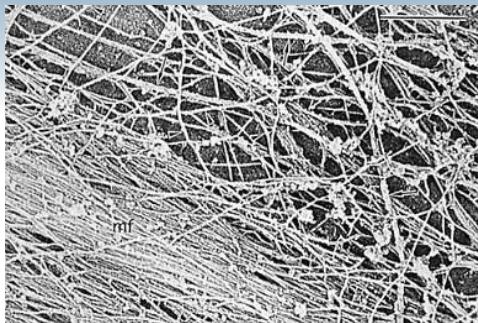


Atzberger 2016

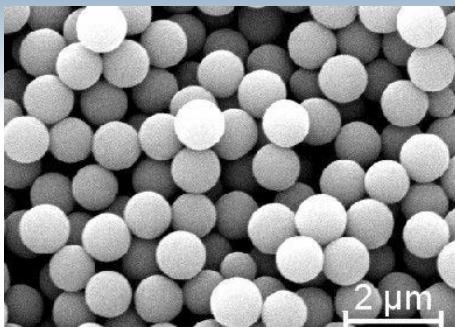
# Motivations

**Stochastic Immersed Boundary Methods (SIBMs)**  
**Eulerian-Lagrangian Methods (ELMs)**  
**Implicit-Solvent Coarse-Grained (IS-CG) Simulations**

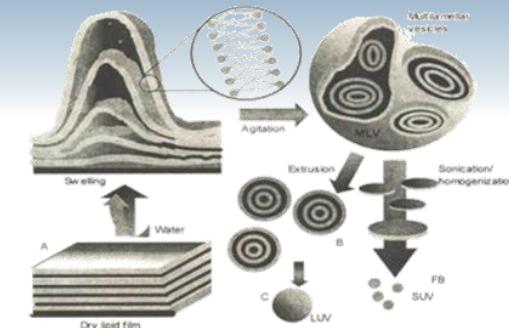
# Motivations: Soft Materials, Complex Fluids, and Other Applications



Gels (Actin)



Colloids



Membranes (lipids)

## Soft Materials / Complex Fluids

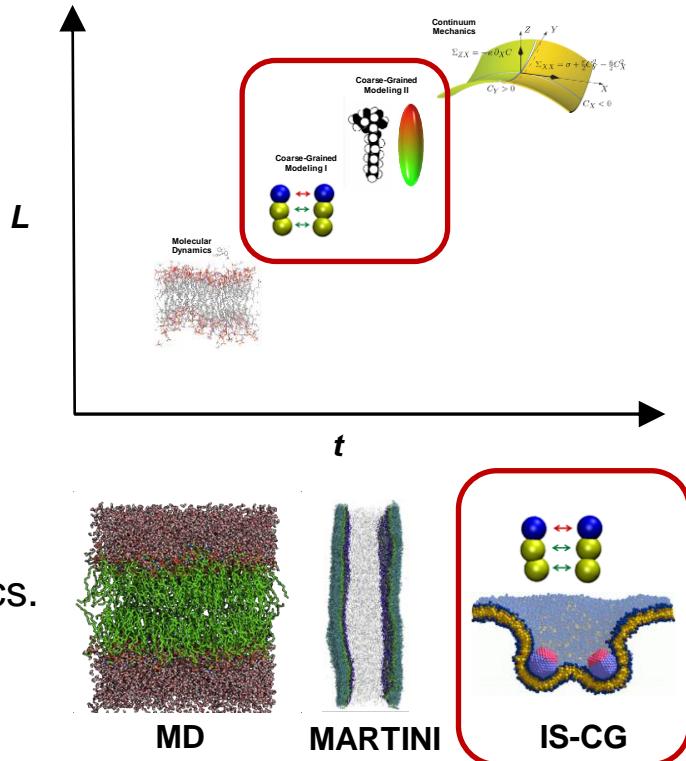
- Microstructure interactions on the order of  $K_B T$ .
- Properties arise from balance of entropy-enthalpy.
- Solvent plays important role (interactions / dynamic responses).

## Approaches

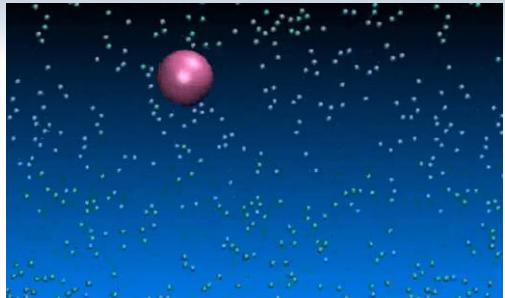
- Atomistic Molecular Dynamics.
- Continuum Mechanics.
- Coarse-Grained Particle Models (solvated or implicitly treated).
- Challenges from phenomena spanning wide temporal-spatial scales.

## Simulation Aims

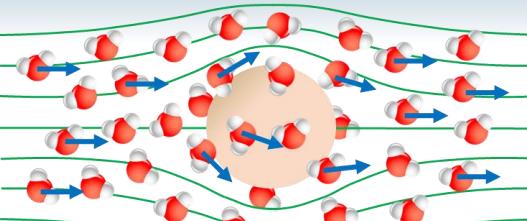
- Investigate how larger-scale mechanics arise from microstructure interactions / kinetics.
- Capture roles of solvent mediated interactions efficiently (i.e. continuum level).
- Resolve microstructure mechanics and dynamics.
- Computational efficiencies allow for accessing larger length and time-scales for investigating wider class of phenomena.



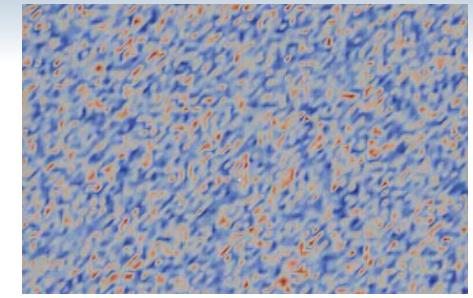
# Fluctuating Hydrodynamics



Brownian Motion: Molecular Collisions



Hydrodynamics + Fluctuations



Continuum Gaussian Random Field

## Landau-Lifschitz fluctuating hydrodynamics

$$\rho \left( \frac{\partial \mathbf{u}(\mathbf{x}, t)}{\partial t} + \mathbf{u}(\mathbf{x}, t) \cdot \nabla \mathbf{u}(\mathbf{x}, t) \right) = \mu \Delta \mathbf{u}(\mathbf{x}, t) - \nabla p(\mathbf{x}, t) + \nabla \cdot \boldsymbol{\Sigma}(\mathbf{x}, t).$$

$$\nabla \cdot \mathbf{u}(\mathbf{x}, t) = 0.$$

$$\langle \Sigma_{ij}(\mathbf{x}, t) \Sigma_{kl}(\mathbf{y}, s) \rangle = 2\mu k_B T (\delta_{ik}\delta_{jl} + \delta_{il}\delta_{jk}) \delta(\mathbf{x} - \mathbf{y}) \delta(t - s).$$

**Fluctuations** arise from spontaneous momentum transfer from molecular-level collisions.

**Stochastic model** of thermal fluctuations captured through random stress  $\Sigma \sim \text{Gaussian}$ .

**Challenges** for analysis and numerical methods presented from the  $\delta$ -correlation in space-time.

**Fluid-structure interactions:** How to incorporate tractably?

# Stochastic Eulerian Lagrangian Methods (SELMs) for Fluid-Structure Interactions

## Fluid Equations

$$\begin{aligned}\rho \frac{\partial \mathbf{u}}{\partial t} &= \mathcal{L}\mathbf{u} + \Lambda[\Upsilon(\mathbf{v} - \Gamma\mathbf{u})] + \lambda + \mathbf{f}_{\text{thm}} \\ \nabla \cdot \mathbf{u} &= 0\end{aligned}$$

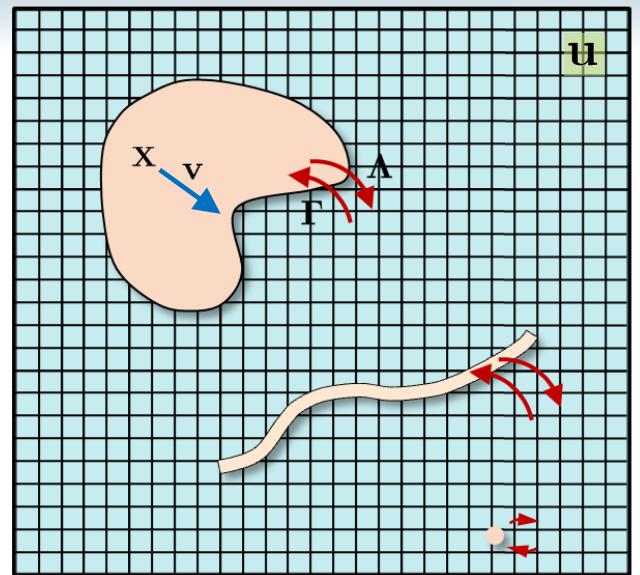
## Microstructure Equations

$$\begin{aligned}\frac{d\mathbf{X}}{dt} &= \mathbf{v} \\ m \frac{d\mathbf{v}}{dt} &= -\Upsilon(\mathbf{v} - \Gamma\mathbf{u}) - \nabla_{\mathbf{X}}\Phi[\mathbf{X}] + \zeta + \mathbf{F}_{\text{thm}}\end{aligned}$$

## Thermal Fluctuations

$$\begin{aligned}\langle \mathbf{f}_{\text{thm}}(s)\mathbf{f}_{\text{thm}}^T(t) \rangle &= -(2k_B T)(\mathcal{L} - \Lambda\Upsilon\Gamma)\delta(t-s) \\ \langle \mathbf{F}_{\text{thm}}(s)\mathbf{F}_{\text{thm}}^T(t) \rangle &= (2k_B T)\Upsilon\delta(t-s) \\ \langle \mathbf{f}_{\text{thm}}(s)\mathbf{F}_{\text{thm}}^T(t) \rangle &= -(2k_B T)\Lambda\Upsilon\delta(t-s).\end{aligned}$$

## Eulerian-Lagrangian Approach



## Operators:

- $\mathcal{L}$  → Fluid dissipation (viscosity).
- $\Upsilon$  → Structure “slip” relative to local flow field.
- $\Gamma$  → Kinematic particle velocity for given flow.
- $\Lambda$  → Induced fluid force density from particle.

## Notation:

- $\mathbf{u} = \mathbf{u}(\mathbf{x}, t)$  → Fluid velocity.
- $\mathbf{X} = \mathbf{X}(\mathbf{q}, t)$  → Structure configuration
- $\mathbf{v} = \mathbf{v}(\mathbf{q}, t)$  → Structure velocity.

# Thermostats

## Berendson, Nose-Hoover

particle momentum



particle momentum



## Langevin

particle momentum



X  
(sink)

thermal  
fluctuations  
(stochastic)

$$\begin{aligned} m \frac{d\mathbf{V}}{dt} &= -\gamma \mathbf{V} - \nabla \Phi(\mathbf{X}) + \sqrt{2k_B T \gamma} \frac{d\mathbf{B}_t}{dt} \\ \frac{d\mathbf{X}}{dt} &= \mathbf{V}. \end{aligned}$$

missing correlations through solvent!

## Fluctuating Hydrodynamics

particle momentum



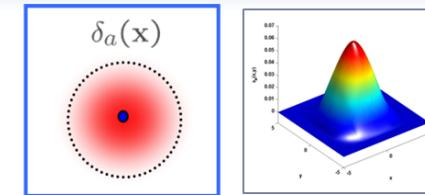
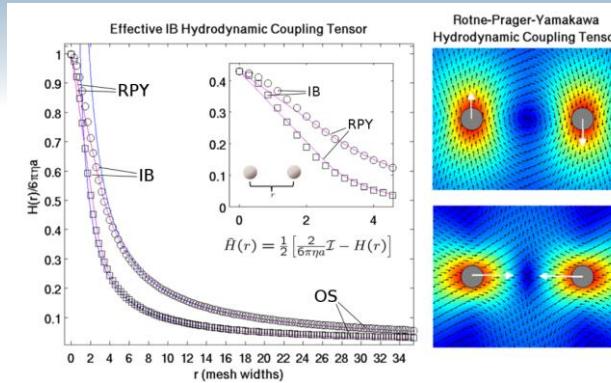
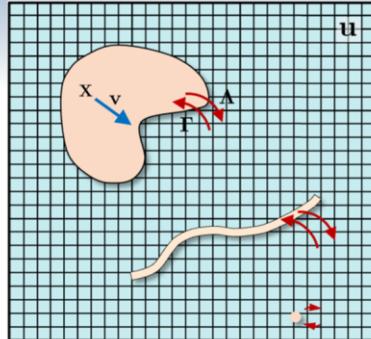
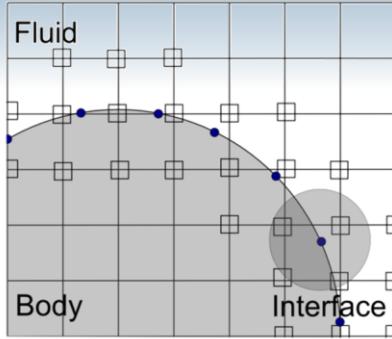
solvent  
(fluid modes)

solvent  
(fluid fluctuations)

$$\begin{aligned} \frac{d\mathbf{X}}{dt} &= \mathbf{v} \\ m \frac{d\mathbf{v}}{dt} &= -\Upsilon (\mathbf{v} - \Gamma \mathbf{u}) - \nabla_{\mathbf{X}} \Phi[\mathbf{X}] + \zeta + \mathbf{F}_{\text{thm}} \end{aligned}$$

lateral momentum transfer : correlations

# Coupling Operators, Immersed Boundary Methods



Peskin delta-function

## SELM Coupling:

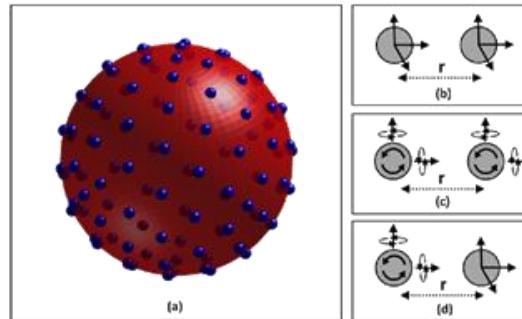
adjoint condition

$$\langle \Gamma \mathbf{v}, \mathbf{F} \rangle = \sum_i [\Gamma \mathbf{v}]_i \cdot [\mathbf{F}]_i = \int_{\Omega} \mathbf{v}(\mathbf{x}) \cdot (\Lambda \mathbf{F})(\mathbf{x}) d\mathbf{x} = \langle \mathbf{v}, \Lambda \mathbf{F} \rangle$$

## IB-Kernel coupling:

$$\Gamma \mathbf{u} = \int_{\Omega} \eta(\mathbf{y} - \mathbf{X}(t)) \mathbf{u}(\mathbf{y}, t) d\mathbf{y}$$

$$\Lambda \mathbf{F} = \eta(\mathbf{x} - \mathbf{X}(t)) \mathbf{F}.$$



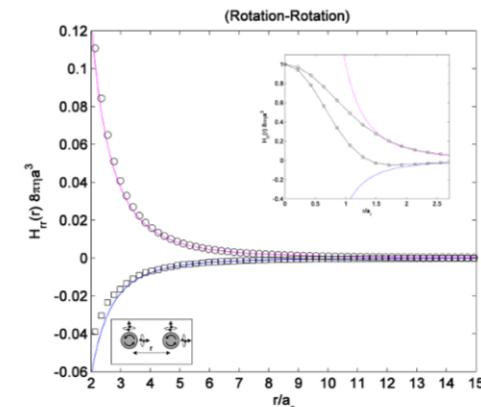
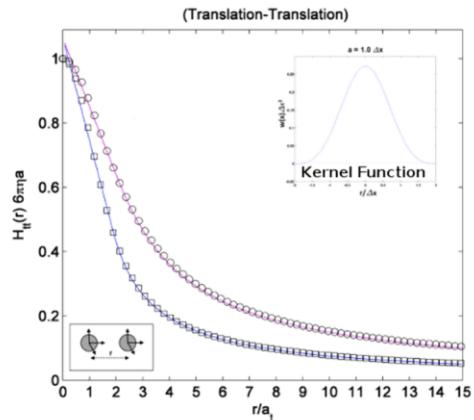
## Generalized Coupling (Faxen)

$$\Gamma_0 \mathbf{u} = \sum_m \left\langle \eta_0(\mathbf{y}_m - (\mathbf{X}_{cm} + \mathbf{z})) \mathbf{u}_m \right\rangle_{\tilde{\mathcal{S}}, |\mathbf{z}|=R} \Delta x_m^3$$

$$\Gamma_1 \mathbf{u} = \frac{3}{2R^2} \sum_m \left\langle \eta_1(\mathbf{y}_m - (\mathbf{X}_{cm} + \mathbf{z})) (\mathbf{z} \times \mathbf{u}_m) \right\rangle_{\tilde{\mathcal{S}}, |\mathbf{z}|=R} \Delta x_m^3.$$

$$\Lambda_0(\mathbf{x}_m) = \left( \left\langle \eta_0(\mathbf{x}_m - (\mathbf{X}_{cm} + \mathbf{z})) \right\rangle_{\tilde{\mathcal{S}}, |\mathbf{z}|=R} \right) \mathbf{F}$$

$$\Lambda_1(\mathbf{x}_m) = -\frac{3}{2R^2} \left( \left\langle \mathbf{z} \eta_1(\mathbf{x}_m - (\mathbf{X}_{cm} + \mathbf{z})) \right\rangle_{\tilde{\mathcal{S}}, |\mathbf{z}|=R} \right) \times \mathbf{T}.$$



# Summary of Regimes for SELMs

## Stochastic Eulerian Lagrangian Methods (SELMs)

### Fluid dynamics:

$$\begin{aligned}\rho \frac{\partial \mathbf{u}}{\partial t} &= \mu \Delta \mathbf{u} - \nabla p + \Lambda[\Upsilon(\mathbf{v} - \Gamma \mathbf{u})] + \mathbf{f}_{\text{thm}} \\ \nabla \cdot \mathbf{u} &= 0\end{aligned}$$

### Structure dynamics:

$$\begin{aligned}\frac{d\mathbf{X}}{dt} &= \mathbf{v} \\ m \frac{d\mathbf{v}}{dt} &= -\Upsilon(\mathbf{v} - \Gamma \mathbf{u}) - \nabla_{\mathbf{X}} \Phi(\mathbf{X}) + \zeta + \mathbf{F}_{\text{thm}}\end{aligned}$$

### Thermal Fluctuations

$$\begin{aligned}\langle \mathbf{f}_{\text{thm}}(s) \mathbf{f}_{\text{thm}}^T(t) \rangle &= -(2k_B T)(\mu \Delta - \Lambda \Upsilon \Gamma) \delta(t-s) \\ \langle \mathbf{F}_{\text{thm}}(s) \mathbf{F}_{\text{thm}}^T(t) \rangle &= (2k_B T) \Upsilon \delta(t-s) \\ \langle \mathbf{f}_{\text{thm}}(s) \mathbf{F}_{\text{thm}}^T(t) \rangle &= -(2k_B T) \Lambda \Upsilon \delta(t-s).\end{aligned}$$

## Microstructure density matched with fluid

### Fluid-structure dynamics:

$$m \ll \rho \ell^3$$

$$\begin{aligned}\frac{d\mathbf{p}}{dt} &= \rho^{-1} \mathcal{L} \mathbf{p} + \Lambda[-\nabla_{\mathbf{X}} \Phi(\mathbf{X})] + (\nabla_{\mathbf{X}} \cdot \Lambda) k_B T + \lambda + \mathbf{g}_{\text{thm}} \\ \frac{d\mathbf{X}}{dt} &= \rho^{-1} \Gamma \mathbf{p} + \Upsilon^{-1}[-\nabla_{\mathbf{X}} \Phi(\mathbf{X})] + \zeta + \mathbf{G}_{\text{thm}}.\end{aligned}$$

$$\nabla_{\mathbf{X}} \cdot \Lambda = \text{Tr}[\nabla_{\mathbf{X}} \Lambda]$$

Phase space compressibility ( $p, X$ ).

### Thermal Fluctuations:

$$\begin{aligned}\langle \mathbf{g}_{\text{thm}}(s) \mathbf{g}_{\text{thm}}^T(t) \rangle &= -(2k_B T) \mathcal{L} \delta(t-s) \\ \langle \mathbf{G}_{\text{thm}}(s) \mathbf{G}_{\text{thm}}^T(t) \rangle &= (2k_B T) \Upsilon^{-1} \delta(t-s) \\ \langle \mathbf{g}_{\text{thm}}(s) \mathbf{G}_{\text{thm}}^T(t) \rangle &= 0.\end{aligned}$$

- Structure momentum no longer tracked.
- Removes a source of stiffness.
- Non-conjugate Hamiltonian formulation yields metric-factor in phase-space.

## Microstructure-fluid no-slip coupling (S-Immersed-Boundary)

### Fluid-Structure Equations:

$$\Upsilon \rightarrow \infty$$

$$\begin{aligned}\frac{d\mathbf{p}}{dt} &= \rho^{-1} \mathcal{L} \mathbf{p} + \Lambda[-\nabla_{\mathbf{X}} \Phi(\mathbf{X})] + (\nabla_{\mathbf{X}} \cdot \Lambda) k_B T + \lambda + \mathbf{g}_{\text{thm}} \\ \frac{d\mathbf{X}}{dt} &= \rho^{-1} \Gamma \mathbf{p}\end{aligned}$$

### Thermal Fluctuations:

$$\langle \mathbf{g}_{\text{thm}}(s) \mathbf{g}_{\text{thm}}^T(t) \rangle = -(2k_B T) \mathcal{L} \delta(t-s).$$

- Structure dynamics no-longer inertial.
- Removes additional sources of stiffness.
- Regime of the Stochastic Immersed Boundary Method.
- Phase-space metric reflected in the drift term.

## Microstructure-fluid stress balance

$$\mu \rightarrow \infty$$

### Fluid-Structure Equations:

$$\begin{aligned}\frac{d\mathbf{X}}{dt} &= H_{\text{SELM}}[-\nabla_{\mathbf{X}} \Phi(\mathbf{X})] + (\nabla_{\mathbf{X}} \cdot H_{\text{SELM}}) k_B T + \mathbf{h}_{\text{thm}} \\ H_{\text{SELM}} &= \Gamma(-\wp \mathcal{L})^{-1} \Lambda\end{aligned}$$

### Thermal Fluctuations:

$$\langle \mathbf{h}_{\text{thm}}(s) \mathbf{h}_{\text{thm}}^T(t) \rangle = (2k_B T) H_{\text{SELM}} \delta(t-s).$$

- Fluid momentum no longer tracked.
- Balance of hydrodynamic stresses with elastic stresses.
- Removes additional sources of stiffness.
- Regime of the Stokesian-Brownian Dynamics (Brady 1980, McCammond 1980's).
- Phase-space metric reflected in the drift term.

# **SELM-LAMMPS Integration**

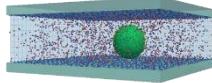
**Molecular Dynamics and Coarse-Grained  
Modeling Approaches**

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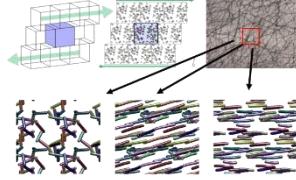


**MANGO-SELM**  
Fluctuating Hydrodynamics Package

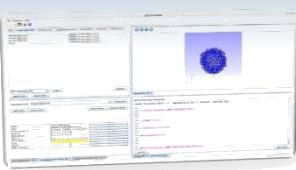
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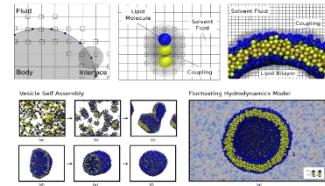
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Graphical modeling interface.



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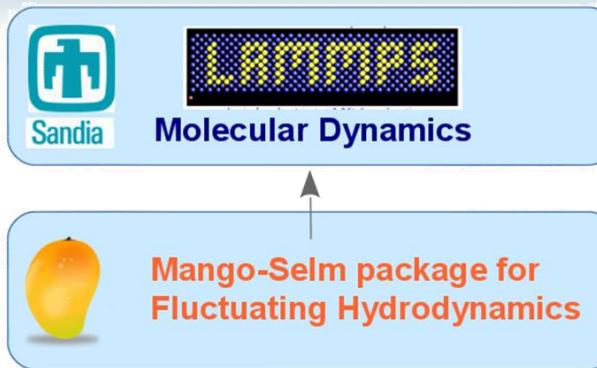
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## Molecular dynamics Integration

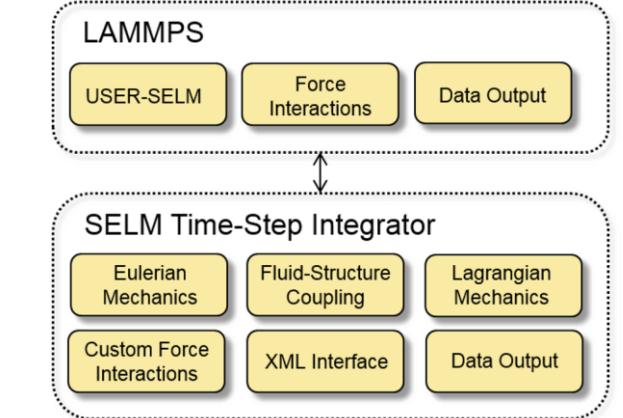
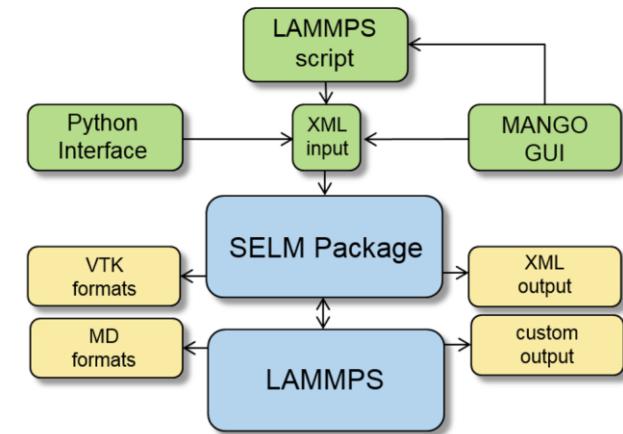


Download: <http://mango-selm.org/>

## Python and Jupyter notebook interfaces



## Modular Design and Extendible



Atzberger 2016

# Mango-Selm Implementation

# Selm Codes: Design and Implementation

## SELM – Source Codes:

LAMMPS-SELM Interface	XML Interface
fix_SELMM.cpp	Atz_XML_Helper_ParseData.cpp
fix_SELMM_XML_Handler.cpp	Atz_XML_Package.cpp
SELM_Package.cpp	Atz_XML_Parser.cpp
Atz_XML_Handler_Example_A.cpp	Atz_XML_SAX_DataHandler.cpp
Atz_XML_Helper_DataHandler_List.cpp	Atz_XML_SAX_Handler_Multilevel.cpp
Atz_XML_Helper_Handler_SkipNextTag.cpp	Atz_XML_SAX_Handler_PrintToScreen.cpp
Eulerian Mechanics	Lagrangian Mechanics
SELM_Eulerian.h	SELM_Lagrangian.h
SELM_Eulerian_Types.h	SELM_Lagrangian_Delegator_XML_Handler.h
SELM_Eulerian_Delegator_XML_Handler.h	SELM_Lagrangian_LAMMPS_ATOM_ANGLE_STYLE.h
SELM_Eulerian_LAMMPS_SHEAR_UNIFORM1_FFTW3.h	SELM_Lagrangian_LAMMPS_ATOM_ANGLE_STYLE_XML_Handler.h
SELM_Eulerian_LAMMPS_SHEAR_UNIFORM1_FFTW3_XML_Handler.h	SELM_Lagrangian_Types.h
SELM_Eulerian_Uniform1_Periodic.h	SELM_Package.h
SELM_Eulerian_Uniform1_Periodic_XML_Handler.h	
Time-Step Integration	Fluid-Structure Coupling
SELM_Integrator.h	SELM_CouplingOperator.h
SELM_Integrator_Delegator_XML_Handler.h	SELM_CouplingOperator_Delegator_XML_Handler.h
SELM_Integrator_FFTW3_Period.h	SELM_CouplingOperator_LAMMPS_SHEAR_UNIFORM1_FFTW3_TABLE1.h
SELM_Integrator_LAMMPS_SHEAR_QUASI_STEADY1_FFTW3.h	SELM_CouplingOperator_LAMMPS_SHEAR_UNIFORM1_FFTW3_TABLE1_XML_Handler.h
SELM_Integrator_LAMMPS_SHEAR_QUASI_STEADY1_FFTW3_XML_Handler.h	

## Features:

**Object-oriented C++ classes** mirroring parts of SELM with **XML parameter files**.

**Delegator design pattern** is used to control the work-flow.

**Four main SELM classes** correspond to:

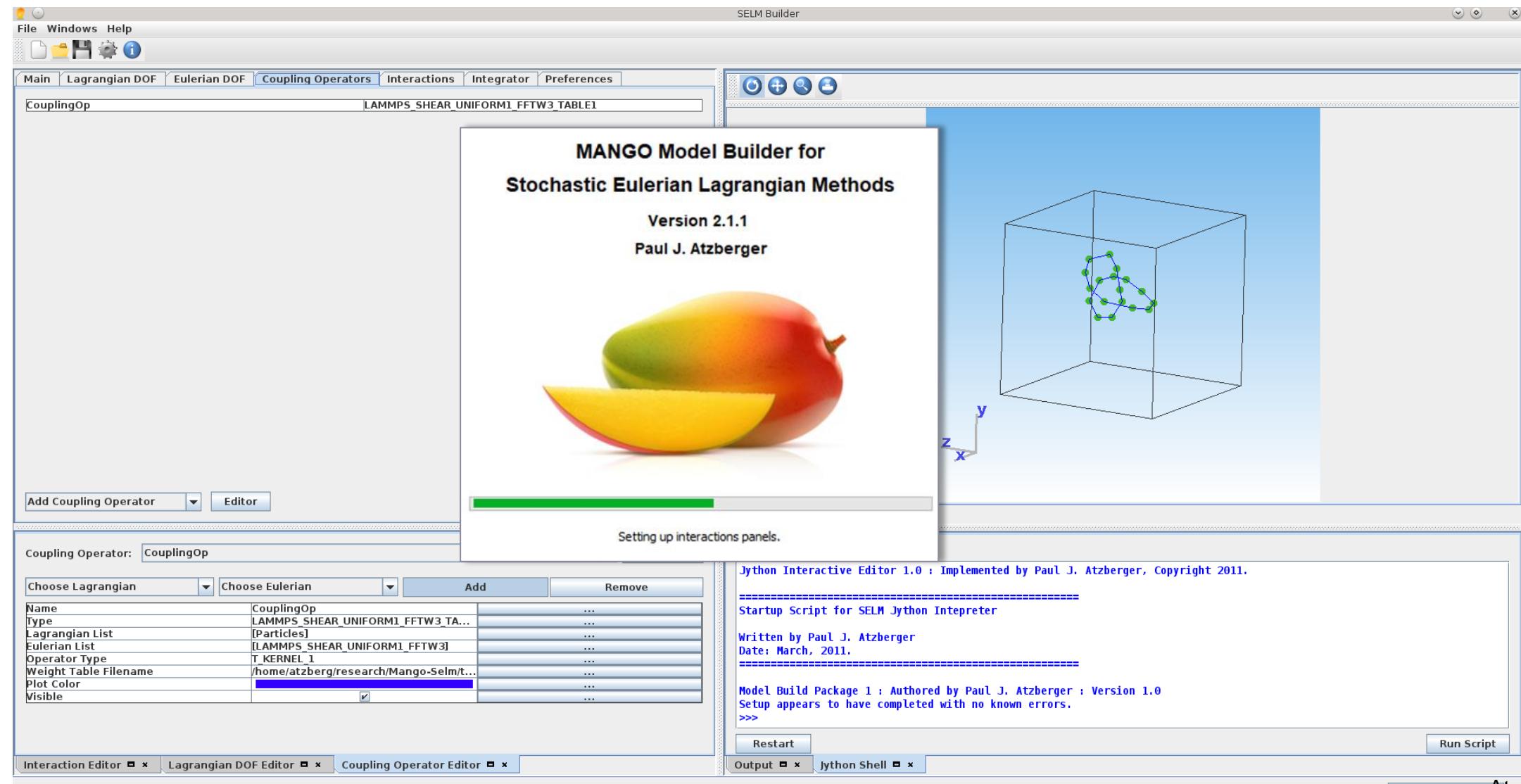
- Eulerian Mechanics
- Lagrangian Mechanics
- Fluid-Structure Coupling (Eulerian-Lagrangian communication)
- Time-Step Integration

**Additional classes** for XML parsing, data generation.

**Designed to be easily extended** for new types of SELM formulations and integrators.

# Mango GUI Model Builder

## Mango - Modeling Software:



# Mango Modeling Software

## Mango - Codes

SELM-Builder	JPanel_Lagrangian.java	SELM_RenderView.java
application_Main.java	JPanel_Lagrangian_CONTROL_PTS_BASIC1.java	TableData_CouplingOperatorList.java
application_Project_Atz_XML_DataHandler_LAMMPS_USER_SEL_M.Builder.java	JPanel_Lagrangian_CONTROL_PTS_FAXEN1.java	TableData_EulerianList.java
application_Project_Atz_XML_DataHandler_SEL_M.Builder.java	JPanel_Lagrangian_LAMMPS_ATOM_ANGLE_STYLE.java	TableData_EulerianList_old.java
application_SharedData.java	JPanel_Lagrangian_NULL.java	TableData_IntegratorList.java
application_Window_About.java	JPanel_Lagrangian_SPECTRAL_FILAMENT1.java	TableData_InteractionList.java
application_Window_Main.java	JTable_CouplingOperator_LAMMPS_SHEAR_UNIFORM1_FFTW3_TABLE1.java	TableData_LagrangianList.java
application_Window_SetupThread.java	JTable_Interaction.java	TableData_LAMMPS_pair_coeff_tableFilename.java
application_Window_Splash.java	JTable_Interaction_LAMMPS_ANGLES.java	TableEditor_CouplingOperatorList.java
Atz_Application_Data_Communication.java	JTable_Interaction_LAMMPS_BONDS.java	TableEditor_EulerianList.java
Atz_ClassLoader.java	JTable_Interaction_LAMMPS_CUSTOM1.java	TableEditor_IntegratorList.java
Atz_ClassLoader_RegstryInfo.java	JTable_Interaction_LAMMPS_PAIR_COEFF.java	TableEditor_InteractionList.java
Atz_DataChangeable.java	JTable_Interaction_LAMMPS_PAIRS_HARMONIC.java	TableEditor_LagrangianList.java
Atz_DataChangeEvent.java	JTable_Interaction_LAMMPS_SPECIAL_BONDS.java	TableEditor_LAMMPS_PAIR_COEFF_tableFilename.java
Atz_DataChangeListener.java	JTable_Interaction_PAIRS_HARMONIC.java	TableModel_CouplingOperator.java
Atz_File_Generator.java	JTable_Lagrangian_ControlPts_BASIC1.java	TableModel_CouplingOperator_IB1.java
Atz_File_Generator_LAMMPS_USER_SEL_M.java	JTable_Lagrangian_CONTROL_PTS.java	TableModel_CouplingOperator_LAMMPS_SHEAR_UNIFORM1_FFTW3_TABLE1.java
Atz_FileFilter.java	JTable_MainData.java	TableModel_CouplingOperator_TABLE1_tmp.java
Atz_Helper_Generic.java	JTable_MainData_XML_LAMMPS_USER_SEL_M.java	TableModel_CouplingOperatorList.java
Atz_Object_Factory.java	JTable_MainData_XML_SEL_M.Builder.java	TableModel_Eulerian.java
Atz_Object_Factory_Generic.java	JTable_Preferences_Other.java	TableModel_Eulerian_LAMMPS_SHEAR_UNIFORM1_FFTW3.java
Atz_Struct_DataChangeEvent.java	JTable_Preferences_Rendering.java	TableModel_Eulerian_SHEAR_UNIFORM1_FFTW3.java
Atz_Struct_DataChangeListener.java	JTable_Preferences_TableDisplay.java	TableModel_Eulerian_SHEAR_UNIFORM1_FFTW3_old.java
Atz_Struct_DataChangeListener_MainData.java	JTableHeaderRender_Default1.java	TableModel_Integrator.java
Atz_Struct_DataChangeListener_Test1.java	SELM_CouplingOperator.java	TableModel_Integrator_LAMMPS_SHEAR_QUASI_STEADY1_FFTW3.java
Atz_Struct_DataContainer.java	SELM_CouplingOperator_IB1.java	TableModel_Integrator_LAMMPS_SHEAR1.java
Atz_Struct_DataContainer_MainData.java	SELM_CouplingOperator_LAMMPS_SHEAR_UNIFORM1_FFTW3_TABLE1.java	TableModel_Integrator_SEL_M_SHEAR1.old.java
Atz_Struct_DataListManager.java	SELM_CouplingOperator_NULL.java	TableModel_Integrator_SHEAR1.java
Atz_XML_Helper_Handler_EulerianRef.java	SELM_CouplingOperator_XML_DataDelegator.java	TableModel_Interaction.java
Atz_XML_Helper_Handler_LagrangianRef.java	SELM_Eulerian.java	TableModel_Interaction_LAMMPS_ANGLES.java
JDialog_Edit_CouplingOperatorList.java	SELM_Eulerian_LAMMPS_SHEAR_UNIFORM1_FFTW3.java	TableModel_Interaction_LAMMPS_BONDS.java
JDialog_Edit_EulerianList.java	SELM_Eulerian.NULL.java	TableModel_Interaction_LAMMPS_CUSTOM1.java
JDialog_Edit_InteractionList.java	SELM_Eulerian_SHEAR_UNIFORM1_FFTW3.java	TableModel_Interaction_LAMMPS_PAIR_COEFF.java
JDialog_Edit_LagrangianList.java	SELM_Eulerian_UNIFORM1_FFTW3.java	TableModel_Interaction_LAMMPS_PAIRS_HARMONIC.java
JDialog_FontSelector.java	SELM_Eulerian_XML_DataDelegator.java	TableModel_Interaction_LAMMPS_SPECIAL_BONDS.java
JDialog_Generate_Simulation_Data_LAMMPS.java	SELM_EulerianInterface_LAMMPS.java	TableModel_InteractionList.java
JDialog_Message_Generate_LAMMPS_USER_SEL_M.java	SELM_EulerianRenderView.java	TableModel_Lagrangian.java
JFrame_SplashProgress.java	SELM_Integrator.java	TableModel_Lagrangian_CONTROL_PTS_BASIC1.java
JPanel_CouplingOperator.java	SELM_Integrator_IB1.java	TableModel_Lagrangian_CONTROL_PTS_FAXEN1.java
JPanel_CouplingOperator_IB1.java	SELM_Integrator_LAMMPS_SHEAR_UNIFORM1_FFTW3_TABLE1.java	TableModel_Lagrangian_LAMMPS_ATOM_ANGLE_STYLE.java
JPanel_CouplingOperator_NULL.java	SELM_Integrator_LAMMPS_SHEAR1.java	TableModel_Lagrangian_SPECTRAL_FILAMENT1.java
JPanel_Demo1.java	SELM_Integrator_NULL.java	TableModel_MainData.java
JPanel_Edit_CouplingOpList.java	SELM_Integrator_SHEAR1.java	TableModel_Preferences_Other.java
JPanel_Edit_InteractionList.java	SELM_Integrator_XML_DataDelegator.java	TableModel_Preferences_Rendering.java
JPanel_Edit_LagrangianList.java	SELM_IntegratorInterface_LAMMPS.java	TableModel_Preferences_TableDisplay.java
JPanel_Editor_CouplingOperator.java	SELM_IntegratorRenderView.java	TableModel_Properties1_Test1.java
JPanel_Editor_Eulerian_DOF.java	SELM_Interaction.java	TableRenderer_CouplingOperatorList.java
JPanel_Editor_Integrator.java	SELM_Interaction_LAMMPS_ANGLES.java	TableRenderer_EulerianList.java
JPanel_Editor_Interaction.java	SELM_Interaction_LAMMPS_BONDS.java	TableRenderer_IntegratorList.java
JPanel_Editor_Lagrangian_DOF.java	SELM_Interaction_LAMMPS_CUSTOM1.java	TableRenderer_InteractionList.java
JPanel_Editor_Test1.java	SELM_Interaction_LAMMPS_PAIR_COEFF.java	TableRenderer_LagrangianList.java
JPanel_Eulerian.java	SELM_Interaction_LAMMPS_PAIRS_HARMONIC.java	TableRenderer_LAMMPS_pair_coeff_tableFilename.java
JPanel_Eulerian_interface_controlActionListener.java	SELM_Interaction_LAMMPS_SPECIAL_BONDS.java	XMLContentHandler.java
JPanel_Eulerian_LAMMPS_SHEAR_UNIFORM1_FFTW3.java	SELM_Interaction_NULL.java	3D_Rendering
JPanel_Eulerian_NULL.java	SELM_Interaction_PAIRS_HARMONIC.java	Atz_LinearAlgebra.java
JPanel_Eulerian_SHEAR_UNIFORM1_FFTW3.java	SELM_Interaction_PAIRS_TABLE.java	Atz3D_Camera.java
JPanel_Eulerian_UNIFORM1_FFTW3.java	SELM_Interaction_TARGET1.java	Atz3D_Element.java
JPanel_Helper_CouplingOperator_GenericTable.java	SELM_Interaction_XML_DataDelegator.java	Atz3D_Element_LinePairs.java
JPanel_Helper_Eulerian_GenericTable.java	SELM_InteractionInterface_LAMMPS.java	Atz3D_Element_Lines.java
JPanel_Helper_Integrator_GenericTable.java	SELM_InteractionInterface_LAMMPS_ANGLES.java	Atz3D_Element_Points.java
JPanel_Helper_Interaction_GenericTable.java	SELM_InteractionInterface_LAMMPS_BONDS.java	Atz3D_Element_Points_DataClosest.java
JPanel_Helper_Lagrangian_GenericTable.java	SELM_InteractionInterface_LAMMPS_PAIR_STYLE.java	Atz3D_Model.java
JPanel_Integrator.java	SELM_InteractionInterface_LAMMPS_PAIR_STYLE_TABLE.java	Atz3D_Model_SEL_M.java
JPanel_Integrator_BO1.java	SELM_InteractionRenderView.java	Atz3D_Renderer.java
JPanel_Integrator_LAMMPS_SHEAR_QUASI_STEADY1_FFTW3.java	SELM_Lagrangian.java	Atz3D_Renderer_SEL_M.java
JPanel_Interaction.java	SELM_Lagrangian_CONTROL_PTS_BASIC1.java	JPanel_Model_View_Composite.java
JPanel_Interaction_LAMMPS_ANGLES.java	SELM_Lagrangian_INTERFACE.java	JPanel_Model_View_Composite_XML_SEL_M.Builder.java
JPanel_Interaction_LAMMPS_BONDS.java	SELM_Lagrangian_LAMMPS_ATOM_ANGLE_STYLE.java	JPanel_Model_View_RenderPanel.java
JPanel_Interaction_LAMMPS_CUSTOM1.java	SELM_Lagrangian_NULL.java	JPanel_Model_View_RenderPanel_XML_SEL_M.Builder.java
JPanel_Interaction_LAMMPS_PAIR_COEFF.java	SELM_Lagrangian_SPECTRAL_FILAMENT1.java	Physical_Units
JPanel_Interaction_LAMMPS_PAIRS_HARMONIC.java	SELM_Lagrangian_wrapper.java	Atz_Unit.java
JPanel_Interaction_LAMMPS_SPECIAL_BONDS.java	SELM_Lagrangian_XML_DataDelegator.java	Atz_UnitsData.java
JPanel_Interaction_NULL.java	SELM_LagrangianInterface_LAMMPS.java	Atz_UnitsRef.java
JPanel_Interaction_PAIRS_HARMONIC.java	SELM_LagrangianRef_XML_DataHandler.java	Atz_UnitsRef_PhysicalUnits.java
JPanel_Interaction_TARGET1.java	SELM_LagrangianRenderView.java	JDialog_Edit_Units_Ref.java

# Mango Modeling Software

## MANGO - Codes

SELM-Builder	
application_Main.java	JPanel_Lagrangian.java
application_Project_Atz_XML_DataHandler_LAMMPS_USER_SEL.M.java	JPanel_Lagrangian_CONTROL_PTS_BASIC1.java
application_Project_Atz_XML_DataHandler_SEL.M.Builder.java	JPanel_Lagrangian_CONTROL_PTS_FAXEN1.java
application_SharedData.java	JPanel_Lagrangian_LAMMPS_ATOM_ANGLE_STYLE.java
application_Window_About.java	JPanel_Lagrangian_NULL.java
application_Window_Main.java	JPanel_Lagrangian_SPECTRAL_FILAMENT1.java
application_Window_Main_SetupThread.java	JTable_CouplingOperator_LAMMPS_SHEAR_UNIFORM1_FFTW3_TABLE1.java
application_Window_Splash.java	JTable_Interaction.java
Atz_Application_Data_Communication.java	JTable_Interaction_LAMMPS_ANGLES.java
Atz_ClassLoader.java	JTable_Interaction_LAMMPS_BONDS.java
Atz_ClassLoader_RegistryInfo.java	JTable_Interaction_LAMMPS_CUSTOM1.java
Atz_DataChangeable.java	JTable_Interaction_LAMMPS_PAIR_COEFF.java
Atz_DataChangeEvent.java	JTable_Interaction_LAMMPS_PAIRS_HARMONIC.java
Atz_DataChangeListener.java	JTable_Interaction_LAMMPS_SPECIAL_BONDS.java
Atz_File_Generator.java	JTable_Interaction_PAIRS_HARMONIC.java
Atz_File_Generator_LAMMPS_USER_SEL.M1.java	JTable_Lagrangian_ControlPts_BASIC1.java
Atz_FileFilter.java	JTable_Langrangian_CONTROL PTS.java
Atz_Helper_Generic.java	JTable_MainData.java
Atz_Object_Factory.java	JTable_MainData_XML_LAMMPS_USER_SEL.M.java
Atz_Object_Factory_Generic.java	JTable_MainData_XML_SEL.M.Builder.java
Atz_Struct_DataChangeEvent.java	JTable_Preferences_Other.java
Atz_Struct_DataChangeListener.java	JTable_Preferences_Rendering.java
Atz_Struct_DataChangeListener_MainData.java	JTable_Preferences_TableDisplay.java

## Features:

**Object-oriented classes in Java** mirroring parts of SELM.

**Dynamic object loaders** for delegator design pattern for control flow (extension after compiled byte-codes).

**Four main SELM classes** correspond to:

- Eulerian Mechanics
- Lagrangian Mechanics
- Fluid-Structure Coupling (Eulerian-Lagrangian communication)
- Time-Step Integration

**Designed to be easily extended** for new types of SELM formulations and integrators.

**Custom classes and interfaces** for rendering models in 3D and interactively editing models.

# Mango Modeling Software

## Mango – Codes:

### 3D Rendering

Atz\_LinearAlgebra.java  
Atz3D\_Camera.java  
Atz3D\_Element.java  
Atz3D\_Element\_LinePairs.java  
Atz3D\_Element\_Lines.java  
Atz3D\_Element\_Points.java  
Atz3D\_Element\_Points\_DataClosest.java

### Atz3D Model.java

Atz3D\_Model\_SELM.java  
Atz3D\_Renderer.java

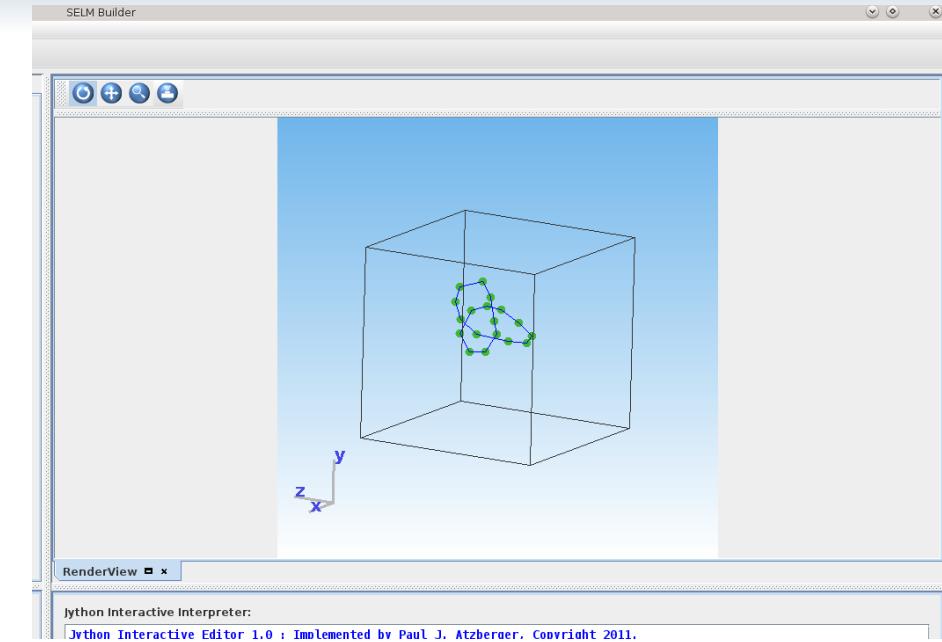
### Atz3D Renderer SELM.java

JPanel\_Model\_View\_Composite.java  
JPanel\_Model\_View\_Composite\_XML\_SELM\_Builder.java  
JPanel\_Model\_View\_RenderPanel.java

JPanel\_Model\_View\_RenderPanel\_XML\_SELM\_Builder.java

### Physical Units

Atz\_Unit.java  
Atz\_UnitsData.java  
Atz\_UnitsRef.java  
Atz\_UnitsRef\_PhysicalUnits.java  
JDialog\_Edit\_Units\_Ref.java



## Features:

**Rendering in 3D** for interactively editing for model geometry.

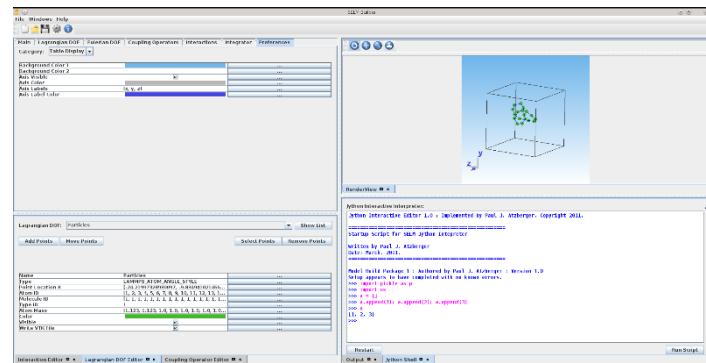
**Interactive editor** features allow for

- interactive views of model
- adding / removing control points
- adding / removing bonds between points
- adding custom force interactions

**Custom classes** implemented for tracking physical units in tables.

# Mango GUI Jython Interface

## MANGO - Modeling Software:



```
Jython Interactive Interpreter:  
Jython Interactive Editor 1.0 : Implemented by Paul J. Atzberger, Copyright 2011.  
=====  
Startup Script for SELM Jython Interpreter  
Written by Paul J. Atzberger  
Date: March, 2011.  
=====  
Model Build Package 1 : Authored by Paul J. Atzberger : Version 1.0  
Setup appears to have completed with no known errors.  
>>> import pickle as p  
>>> import os  
>>> a = []  
>>> a.append(1); a.append(2); a.append(3)  
>>> a  
[1, 2, 3]  
>>>
```

Restart

## Jython Terminal:

Custom classes implement interactive terminal based on Jython.

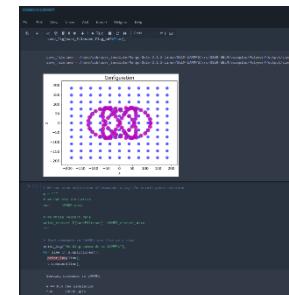
Wrapper jython classes implemented for MANGO interface and SELM data structures.

Editor features allow for

- jython/python scripting to construct models
- custom GUI windows : interactive components in MANGO
- post-processing scripts
- generation of SELM XML files from the constructed MANGO data structures.

Jupyter notebooks and Python interface now also available (directly with Selm-Lammps library).

Python and Jupyter notebook interfaces



Atzberger 2016

# Selm-Lammps Integration

## Python and Jupyter Notebook Interfaces

# Tips for SELM Package: Installation and Usage

## Instructions

**Pre-compiled binaries:** for (Debian 9+/Ubuntu and Centos 7+, Python 3.6+).

### Quick start:

```
>> pip install selm-lammps  
test: >> python -c "from selm_lammps.tests import t1; t1.test()"
```

Alternatively, can use *docker run -it ubuntu:20.04 /bin/bash; (use python3)*.

**Examples, docs, source:** see <http://mango-selm.org/>

### Directories:

- src/USER-SELM: main C/C++ interface codes for SELM package
- examples/USER/selm: example models and simulation scripts
- lib/selm: library of SELM integrators and related algorithms

### Installing Python components (uses lammps.py, lammps.so):

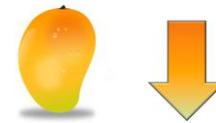
- Recommended to use *conda* or *virtualenv* with python >=3.6
- Examples for Jupyter notebooks, python scripts, for running simulations.
- See README files for more details.

### Jupyter Notebooks and Python-based Simulations:

- Uses python-interfaces to LAMMPs.
- L.command(cmd\_str); runs the command in cmd\_str.
- Model building using python wrapper
  - sets up particles
  - sets up interactions, many possible types and potential available
  - sets up the simulation parameters.

Mango-Selm | Fluctuating H

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### Downloads

Please join our [mailing list](#) for the announcement of updated releases.

- Download Latest Release

Download: <http://mango-selm.org/>

### Python and Jupyter notebook interfaces



```
In [*]: # We can send collection of commands using the triple quote notation
s = """
# == Run the simulation
run    10000 upto

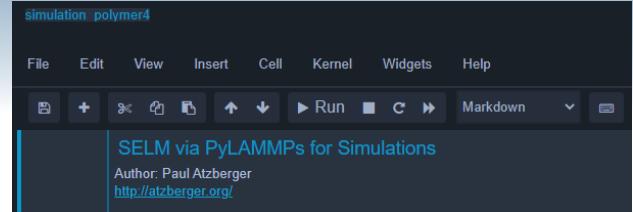
# == Write restart data
write_restart ${basefilename}.LAMMPS_restart_data
"""

# Feed commands to LAMMPS one line at a time
print_log("Sending commands to LAMMPS");
for line in s.splitlines():
    print_log(line);
    L.command(line);

Sending commands to LAMMPS

# == Run the simulation
run    10000 upto
```

## Python Jupyter Notebook



```
simulation polymer4
```

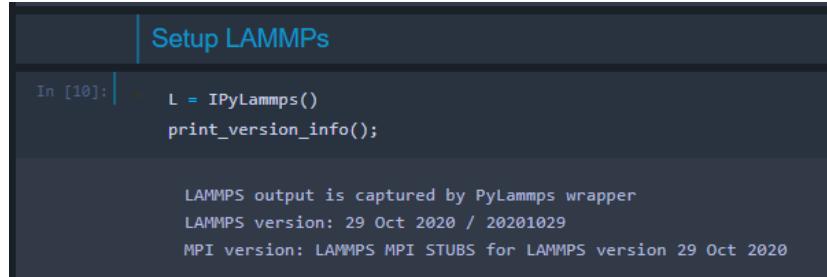
```
File Edit View Insert Cell Kernel Widgets Help
```

```
Run Markdown
```

```
SELM via PyLAMMPS for Simulations
Author: Paul Atzberger
http://atzberger.org/
```

# Jupyter Notebook and Python Interface

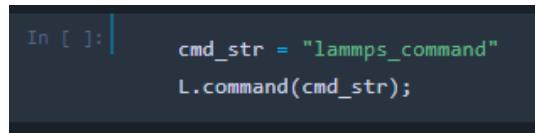
## Create SelM-Lammps instance



```
In [10]: L = IPyLammps()
print_version_info()

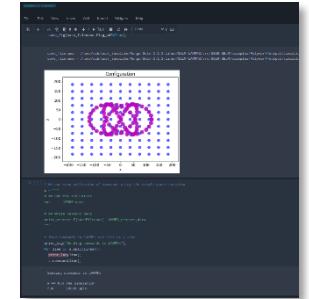
LAMMPS output is captured by PyLammps wrapper
LAMMPS version: 29 Oct 2020 / 20201029
MPI version: LAMMPS MPI STUBS for LAMMPS version 29 Oct 2020
```

## Issuing commands

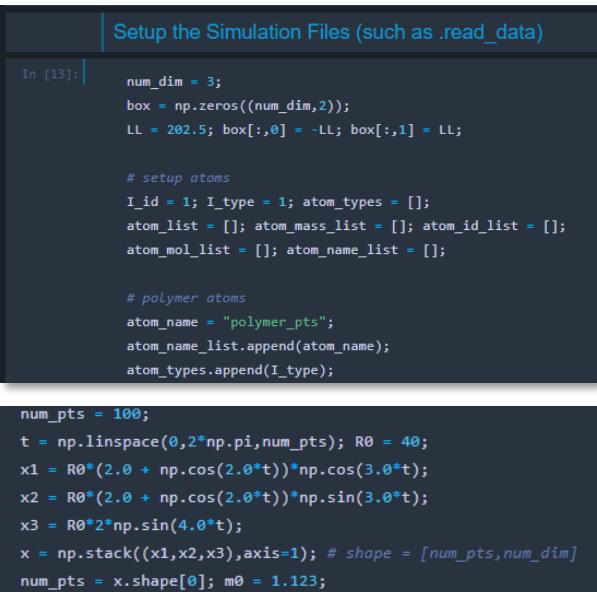


```
In [ ]: cmd_str = "lammps_command"
L.command(cmd_str);
```

## Python and Jupyter notebook interfaces



## Setup model geometry and interactions



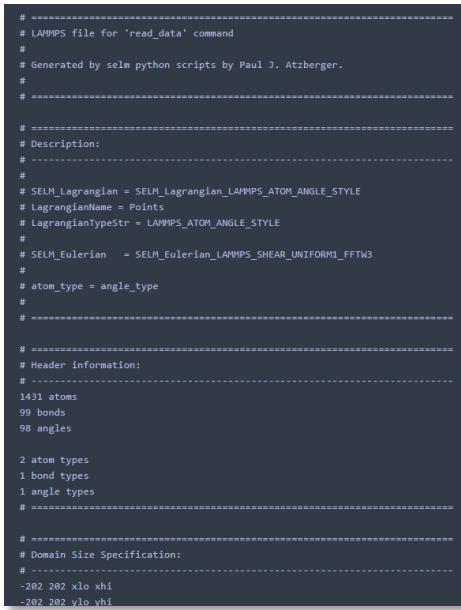
```
In [13]: num_dim = 3;
box = np.zeros((num_dim,2));
LL = 202.5; box[:,0] = -LL; box[:,1] = LL;

# setup atoms
I_id = 1; I_type = 1; atom_types = [];
atom_list = []; atom_mass_list = []; atom_id_list = [];
atom_mol_list = []; atom_name_list = [];

# polymer atoms
atom_name = "polymer_pts";
atom_name_list.append(atom_name);
atom_types.append(I_type);

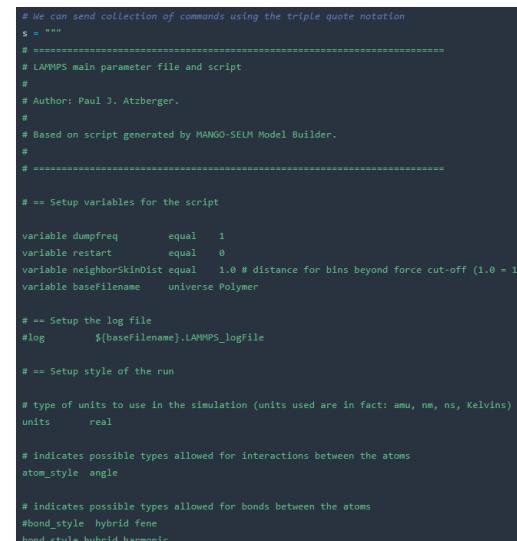
num_pts = 100;
t = np.linspace(0,2*np.pi,num_pts); R0 = 40;
x1 = R0*(2.0 + np.cos(2.0*t))*np.cos(3.0*t);
x2 = R0*(2.0 + np.cos(2.0*t))*np.sin(3.0*t);
x3 = R0*2*np.sin(4.0*t);
x = np.stack((x1,x2,x3),axis=1); # shape = [num_pts,num_dim]
num_pts = x.shape[0]; m0 = 1.123;
```

## Model configuration (generated file)



```
# LAMMPS file for 'read_data' command
#
# Generated by selm python scripts by Paul J. Atzberger.
#
# =====
#
# Description:
#
# SELM_Lagrangian = SELM_Lagrangian_LAMMPS_ATOM_ANGLE_STYLE
# LagrangianName = Points
# LagrangianTypeStr = LAMMPS_ATOM_ANGLE_STYLE
#
# SELM_Eulerian = SELM_Eulerian_LAMMPS_SHEAR_UNIFORM1_FFTW3
# atom_type = angle_type
#
# =====
#
# Header information:
#
# 1431 atoms
# 99 bonds
# 98 angles
#
# 2 atom types
# 1 bond types
# 1 angle types
#
# =====
#
# Domain Size Specification:
#
# -202 202 xlo xhi
# -202 202 ylo yhi
```

## Setup parameters



```
# We can send collection of commands using the triple quote notation
s = """
# =====
# LAMMPS main parameter file and script
#
# Author: Paul J. Atzberger.
#
# Based on script generated by MANGO-SELM Model Builder.
#
# =====

# == Setup variables for the script

variable dumpfreq      equal    1
variable restart        equal    0
variable neighborSkinDist equal  1.0 # distance for bins beyond force cut-off (1.0 = 1.0)
variable basefilename   universe Polymer

# == Setup the log file
#log      ${basefilename}.LAMMPS_logFile

# == Setup style of the run

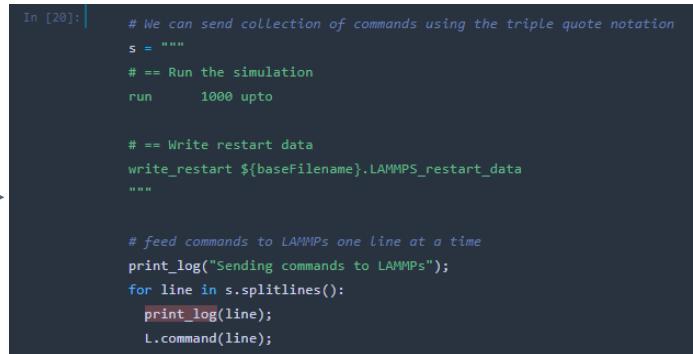
# type of units to use in the simulation (units used are in fact: amu, nm, ns, Kelvins)
units      real

# indicates possible types allowed for interactions between the atoms
atom_style angle

# indicates possible types allowed for bonds between the atoms
#bond_style hybrid fene
#bond_style_hybrid_harmone
```

SELM XML files

## Run simulation and analysis



```
In [20]: # We can send collection of commands using the triple quote notation
s = """
# == Run the simulation
run      1000 upto

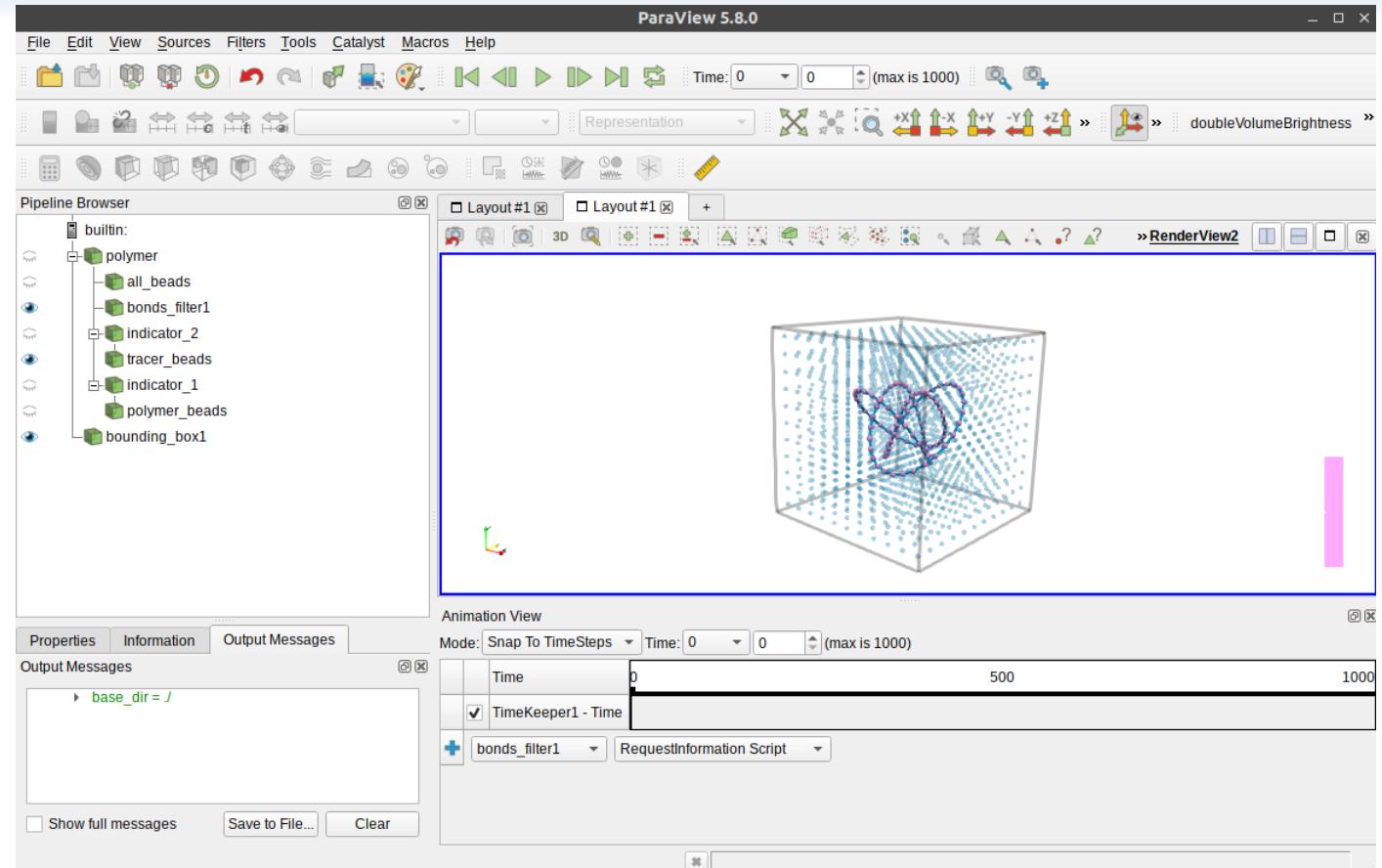
# == Write restart data
write_restart ${basefilename}.LAMMPS_restart_data
"""

# feed commands to LAMMPS one line at a time
print_log("Sending commands to LAMMPS");
for line in s.splitlines():
    print_log(line);
    L.command(line);
```

## Interface allows for:

- checking intermediate results
- resuming simulations
- perform analysis and visualization.

# Paraview for Visualization



## Features:

- Processing VTK data output files (.vti, .vtu, .vtr)
- Selm python scripts for loading and visualizing models.
- Rendering capabilities and movie generation.
- Analysis capabilities for statistics and other model properties.

# How to Setup Model in Practice

## Examples

# Particles: Thermal Fluctuations with Hydrodynamic Correlations

Directory:

examples/hydro1

Jupyter notebook:

simulation\_hydro1.ipynb

SELM via PyLAMMPS for Simulations

Author: Paul Atzberger

<http://atzberger.org/>

```
import os;
script_base_name = "simulation_particles1";
script_dir = os.getcwd();

# import the lammps module
try:
    from selm_lammps.lammps import IPyLammps # use this for the pip install of pre-built package
    lammps_import_comment = "from selm_lammps.lammps import IPyLammps";
    from selm_lammps import util as atz_util;
except Exception as e:
    from lammps import IPyLammps # use this for direct install of package
    lammps_import_comment = "from lammps import IPyLammps";
    from atz_lammps import util as atz_util;
except Exception as e: # if fails to import, report the exception
    print(e);
    lammps_import_comment = "import failed";
```

Setup LAMMPS

```
L = IPyLammps();
atz_util.print_version_info(L);
```

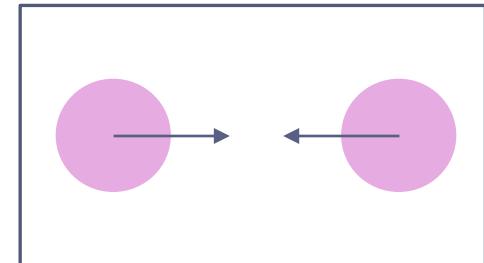
LAMMPS output is captured by PyLammps wrapper  
LAMMPS version: 29 Oct 2020 / 20201029  
MPI version: LAMMPS MPI STUBS for LAMMPS version 29 Oct 2020

Setup the Model and Simulation Files (such as .read\_data)

```
num_dim = 3;
box = np.zeros((num_dim,2));
LL = 202.5; box[:,0] = -LL; box[:,1] = LL;

# setup atoms
I_id = 1; I_type = 1; atom_types = [];
atom_list = []; atom_mass_list = []; atom_id_list = [];
atom_mol_list = []; atom_name_list = [];
```

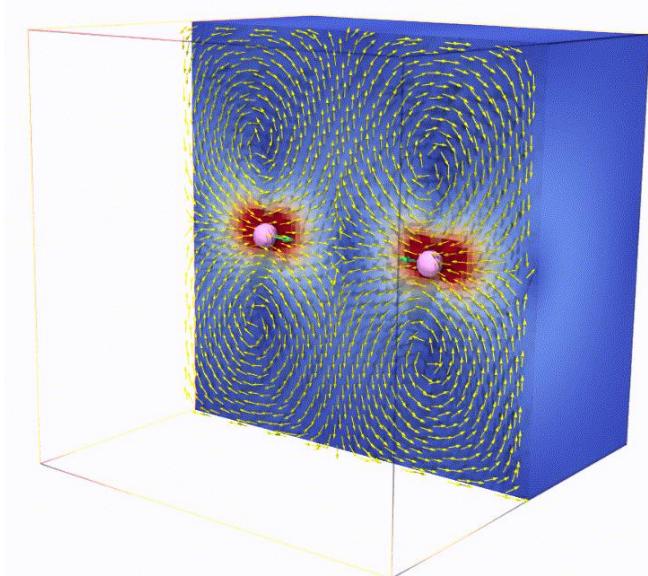
particles w/ hydrodynamics



Perform the simulation

```
# == Setup the SELM integrator
fix 1 all selm Main.SELM_params

# feed commands to LAMMPS one line at a time
print_log("Sending commands to LAMMPS");
for line in s.splitlines():
    print_log(line);
    L.command(line);
```



# Particles: Thermal Fluctuations with Hydrodynamic Correlations

Directory:  
examples/particles1

Jupyter notebook:  
simulation\_particles1.ipynb

## SELM via PyLAMMPS for Simulations

Author: Paul Atzberger  
<http://atzberger.org/>

```
import os;
script_base_name = "simulation_particles1";
script_dir = os.getcwd();

# import the lammps module
try:
    from selm_lammps.lammps import IPyLammps # use this for the pip install of pre-built package
    lammps_import_comment = "from selm_lammps.lammps import IPyLammps";
    from selm_lammps import util as atz_util;
except Exception as e:
    from lammps import IPyLammps # use this for direct install of package
    lammps_import_comment = "from lammps import IPyLammps";
    from atz_lammps import util as atz_util;
except Exception as e: # if fails to import, report the exception
    print(e);
    lammps_import_comment = "import failed";
```

## Setup LAMMPS

```
L = IPyLammps();
atz_util.print_version_info(L);

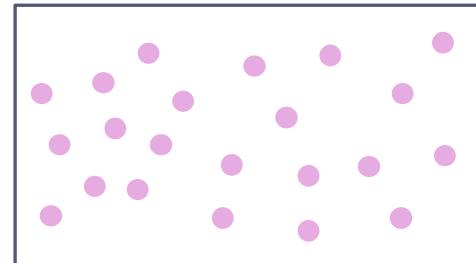
LAMMPS output is captured by PyLammps wrapper
LAMMPS version: 29 Oct 2020 / 20201029
MPI version: LAMMPS MPI STUBS for LAMMPS version 29 Oct 2020
```

## Setup the Model and Simulation Files (such as .read\_data)

```
num_dim = 3;
box = np.zeros((num_dim,2));
LL = 202.5; box[:,0] = -LL; box[:,1] = LL;

# setup atoms
I_id = 1; I_type = 1; atom_types = [];
atom_list = []; atom_mass_list = []; atom_id_list = [];
atom_mol_list = []; atom_name_list = [];
```

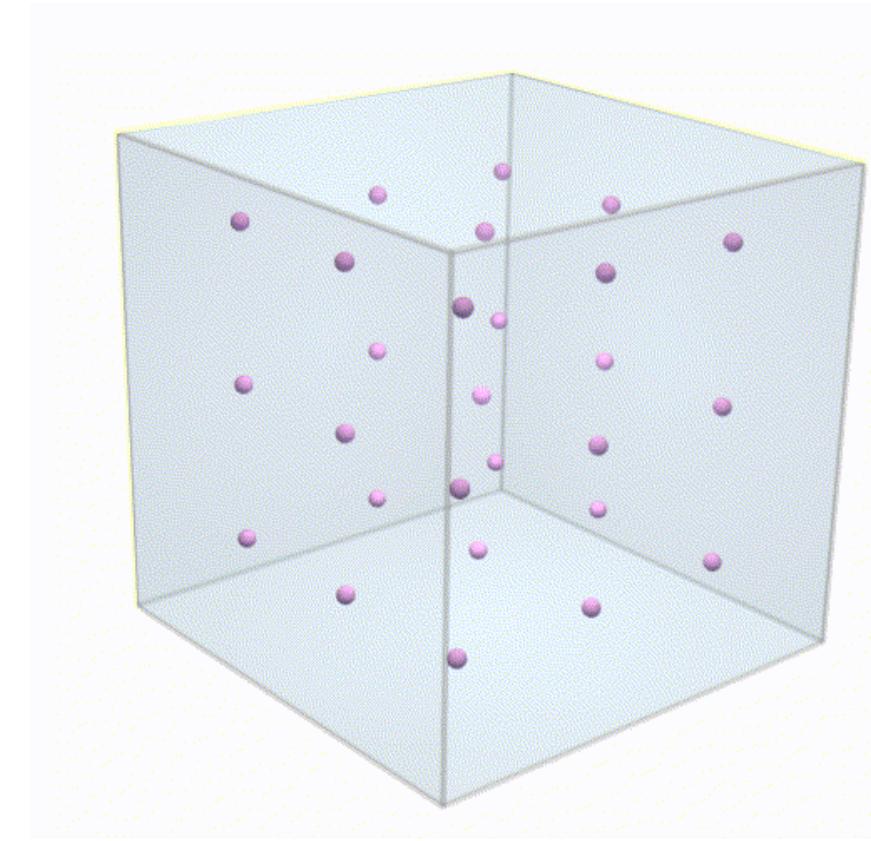
particle diffusion w/  
hydrodynamic correlations



## Perform the simulation

```
# == Setup the SELM integrator
fix 1 all selm Main.SELM_params

# feed commands to LAMMPS one line at a time
print_log("Sending commands to LAMMPS");
for line in s.splitlines():
    print_log(line);
    L.command(line);
```



# Polymer: Thermal Fluctuations with Hydrodynamic Correlations

Directory:

examples/polymer4

Jupyter notebook:

simulation\_polymer4.ipynb

Create Selm-Lammps instance

```
Setup LAMMPS

In [10]: L = IPyLammps()
print_version_info();

LAMMPS output is captured by PyLammps wrapper
LAMMPS version: 29 Oct 2020 / 20201029
MPI version: LAMMPS MPI STUBS for LAMMPS version 29 Oct 2020
```

Setup model geometry and interactions

```
Setup the Simulation Files (such as .read_data)

In [13]: num_dim = 3;
box = np.zeros((num_dim,2));
LL = 202.5; box[:,0] = -LL; box[:,1] = LL;

# setup atoms
I_id = 1; I_type = 1; atom_types = [];
atom_list = []; atom_mass_list = []; atom_id_list = [];
atom_mol_list = []; atom_name_list = [];

# polymer atoms
atom_name = "polymer_pts";
atom_name_list.append(atom_name);
atom_types.append(I_type);

num_pts = 100;
```

```
t = np.linspace(0,2*np.pi,num_pts); R0 = 40;
x1 = R0*(2.0 + np.cos(2.0*t))*np.cos(3.0*t);
x2 = R0*(2.0 + np.cos(2.0*t))*np.sin(3.0*t);
x3 = R0*2*np.sin(4.0*t);
x = np.stack((x1,x2,x3),axis=1); # shape = [num_pts,num_dim]
num_pts = x.shape[0]; m0 = 1.123;
```

Run simulation and analysis

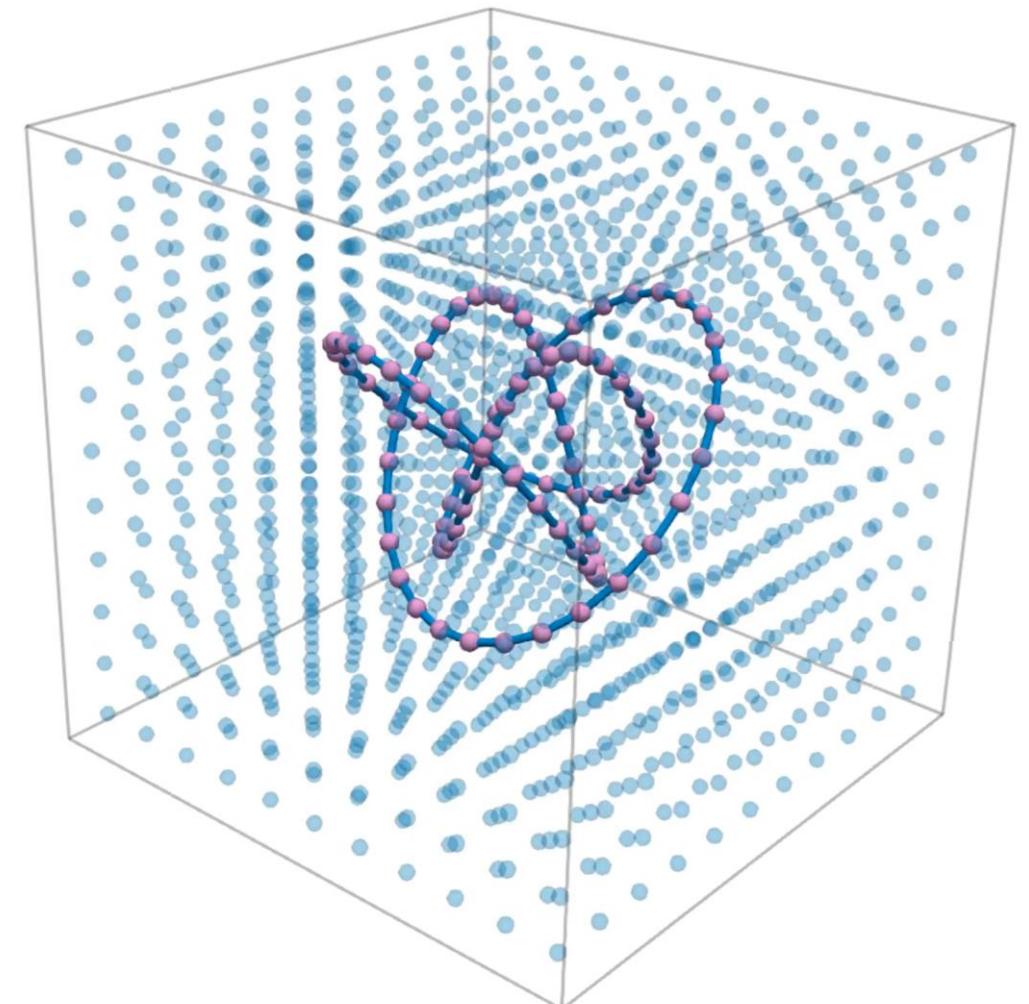
```
In [20]: # We can send collection of commands using the triple quote notation
s = """
# == Run the simulation
run    1000 upto

# == Write restart data
write_restart ${basefilename}.LAMMPS_restart_data
"""

# feed commands to LAMMPS one Line at a time
print_log("Sending commands to LAMMPS");
for line in s.splitlines():
    print_log(line);
    L.command(line);
```

SELM XML files

Polymer knot fluctuations w/ hydrodynamic correlations



# Polymer Knot: Subject to Shearing and Thermal Fluctuations

Directory:

examples/polymer4

Jupyter notebook:

simulation\_polymer4.ipynb

Create Selm-Lammps instance

```
Setup LAMMPS

In [10]: L = IPyLammps()
print_version_info();

LAMMPS output is captured by PyLammps wrapper
LAMMPS version: 29 Oct 2020 / 20201029
MPI version: LAMMPS MPI STUBS for LAMMPS version 29 Oct 2020
```

Setup model geometry and interactions

```
Setup the Simulation Files (such as .read_data)

In [13]: num_dim = 3;
box = np.zeros((num_dim,2));
LL = 202.5; box[:,0] = -LL; box[:,1] = LL;

# setup atoms
I_id = 1; I_type = 1; atom_types = [];
atom_list = []; atom_mass_list = []; atom_id_list = [];
atom_mol_list = []; atom_name_list = [];

# polymer atoms
atom_name = "polymer_pts";
atom_name_list.append(atom_name);
atom_types.append(I_type);

num_pts = 100;
t = np.linspace(0,2*np.pi,num_pts); R0 = 40;
x1 = R0*(2.0 + np.cos(2.0*t))*np.cos(3.0*t);
x2 = R0*(2.0 + np.cos(2.0*t))*np.sin(3.0*t);
x3 = R0*2*np.sin(4.0*t);
x = np.stack((x1,x2,x3),axis=1); # shape = [num_pts,num_dim]
num_pts = x.shape[0]; m0 = 1.123;
```

Run simulation and analysis

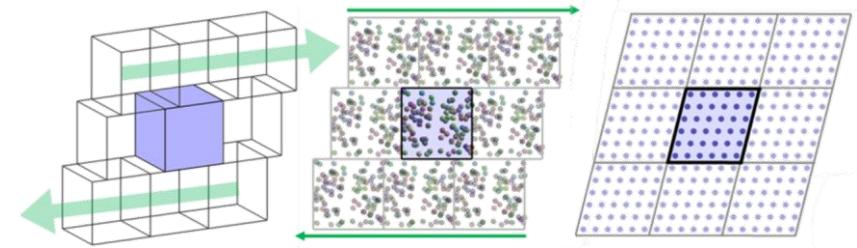
```
In [20]: # We can send collection of commands using the triple quote notation
s = """
# == Run the simulation
run    1000 upto

# == Write restart data
write_restart ${basefilename}.LAMMPS_restart_data
"""

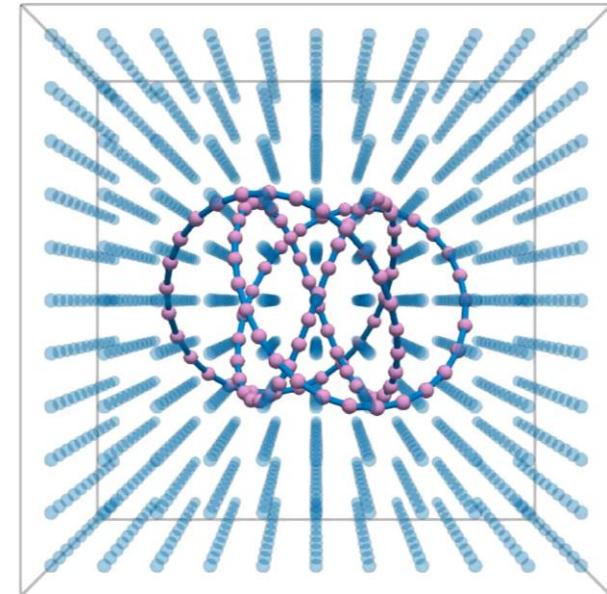
# feed commands to LAMMPS one Line at a time
print_log("Sending commands to LAMMPS");
for line in s.splitlines():
    print_log(line);
    L.command(line);
```

SELM XML files

Shearing boundaries: Less-Edwards conditions

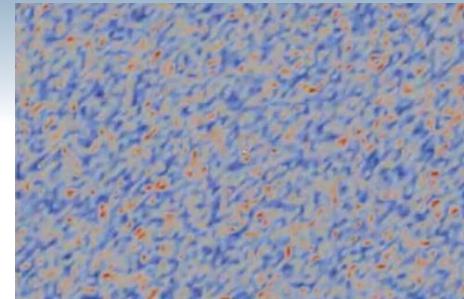
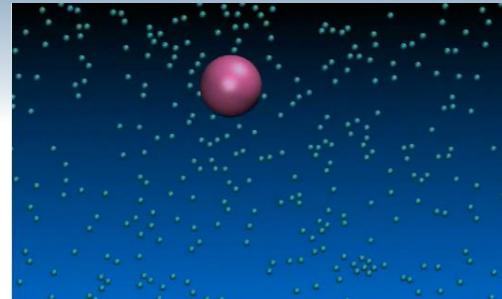
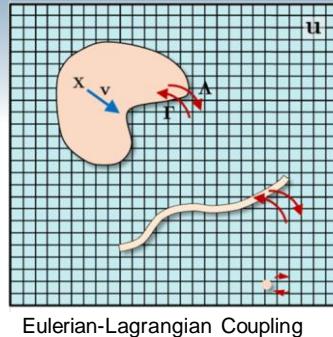
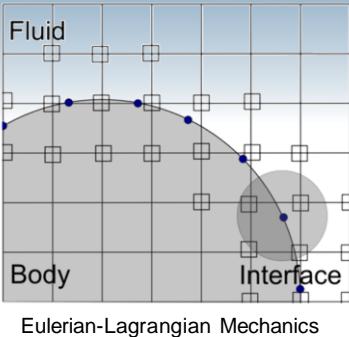


Polymer knot fluctuations in shear flow



# **Further Simulations with SELMs**

# SELM Fluctuating Hydrodynamics



## SELM Inertial Regime I:

### hydrodynamics

$$\rho \frac{\partial \mathbf{u}}{\partial t} = \mu \Delta \mathbf{u} - \nabla p + \Lambda [\Upsilon(\mathbf{v} - \Gamma \mathbf{u})] + \mathbf{f}_{thm}$$

$$\nabla \cdot \mathbf{u} = 0.$$

### microstructure

$$\frac{d\mathbf{X}}{dt} = \mathbf{v}$$

$$m \frac{d\mathbf{v}}{dt} = -\Upsilon(\mathbf{v} - \Gamma \mathbf{u}) - \nabla_X \Phi[X] + \mathbf{F}_{thm}.$$

### thermal fluctuations

$$\langle \mathbf{f}_{thm}(s) \mathbf{f}_{thm}^T(t) \rangle = -(2k_B T) (\mathcal{L} - \Lambda \Upsilon \Gamma) \delta(t-s)$$

$$\langle \mathbf{F}_{thm}(s) \mathbf{F}_{thm}^T(t) \rangle = (2k_B T) \Upsilon \delta(t-s)$$

$$\langle \mathbf{f}_{thm}(s) \mathbf{F}_{thm}^T(t) \rangle = -(2k_B T) \Lambda \Upsilon \delta(t-s).$$

## SELM Overdamped Regime IV:

### microstructure + hydrodynamics (quasi-steady)

$$\frac{d\mathbf{X}}{dt} = H_{SELM}[-\nabla_{\mathbf{X}} \Phi(\mathbf{X})]$$

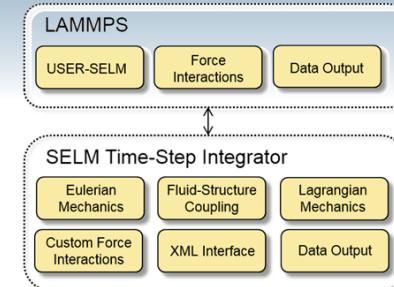
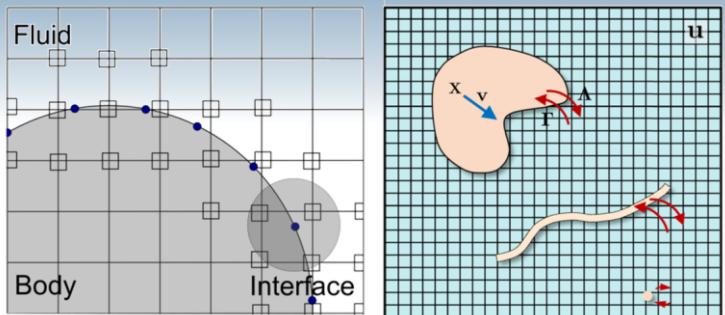
$$+ (\nabla_{\mathbf{X}} \cdot H_{SELM}) k_B T + \mathbf{h}_{thm}$$

$$H_{SELM} = \Gamma(-\wp \mathcal{L})^{-1} \Lambda$$

### thermal fluctuations

$$\langle \mathbf{h}_{thm}(s) \mathbf{h}_{thm}^T(t) \rangle = (2k_B T) H_{SELM} \delta(t-s).$$

# MANGO-SELM Simulation Software



## SELM Inertial Regime I (Verlet-style temporal integration):

### microstructure

$$\begin{aligned} \mathbf{v}^{n+\frac{1}{2}} &= \mathbf{v}^n + \frac{\Delta t}{2} m^{-1} \mathbf{F}^n \\ &+ \frac{\Delta t}{2} \left( -m^{-1} \Upsilon \left( \mathbf{v}^{n-\frac{1}{2}} - \Gamma^n \mathbf{u}^{n-\frac{1}{2}} \right) \right. \\ &\quad \left. + m^{-1} \mathbf{g}^{n-\frac{1}{2}} \right) \end{aligned}$$

$$\mathbf{X}^{n+1} = \mathbf{X}^n + \mathbf{v}^{n+\frac{1}{2}} \Delta t$$

### microstructure

$$\begin{aligned} \mathbf{v}^{n+1} &= \mathbf{v}^{n+\frac{1}{2}} + \frac{\Delta t}{2} m^{-1} \mathbf{F}^{n+1} \\ &+ \frac{\Delta t}{2} \left( -m^{-1} \Upsilon \left( \mathbf{v}^{n+\frac{1}{2}} - \Gamma^{n+1} \mathbf{u}^{n+\frac{1}{2}} \right) \right. \\ &\quad \left. + m^{-1} \mathbf{g}^{n+\frac{1}{2}} \right) \end{aligned}$$

.

### hydrodynamics

$$\begin{aligned} \mathbf{u}^{n+\frac{1}{2}} &= \mathbf{u}^n + \frac{\Delta t}{2} \rho^{-1} \mu L \mathbf{u}^{n-\frac{1}{2}} \\ &- \frac{\Delta t}{2} \left( \rho^{-1} \Lambda^n \left[ -\Upsilon \left( \mathbf{v}^{n-\frac{1}{2}} - \Gamma^n \mathbf{u}^{n-\frac{1}{2}} \right) \right. \right. \\ &\quad \left. \left. + \mathbf{g}^{n-\frac{1}{2}} \right] \right) \\ &+ \mathbf{h}^{n-\frac{1}{2}} \end{aligned}$$

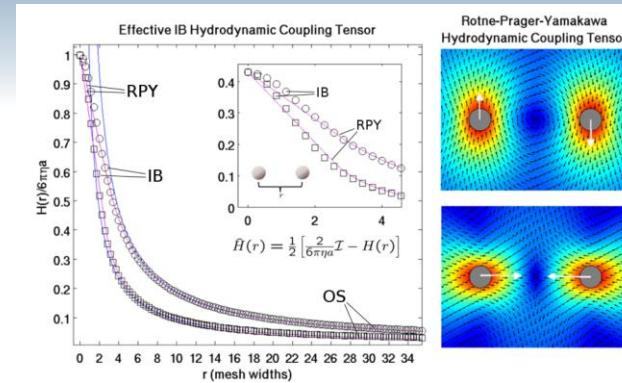
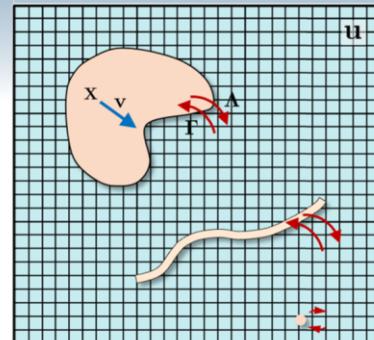
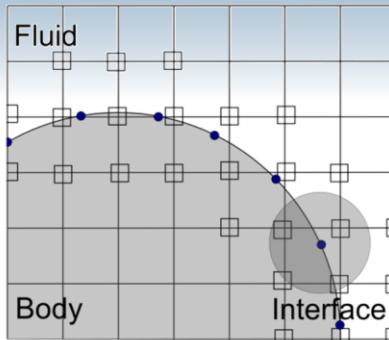
### hydrodynamics

$$\begin{aligned} \mathbf{u}^{n+1} &= \mathbf{u}^{n+\frac{1}{2}} + \frac{\Delta t}{2} \rho^{-1} \mu L \mathbf{u}^{n+\frac{1}{2}} \\ &- \frac{\Delta t}{2} \left( \rho^{-1} \Lambda^{n+1} \left[ -\Upsilon \left( \mathbf{v}^{n+\frac{1}{2}} - \Gamma^{n+1} \mathbf{u}^{n+\frac{1}{2}} \right) \right. \right. \\ &\quad \left. \left. + \mathbf{g}^{n+\frac{1}{2}} \right] \right) \\ &+ \mathbf{h}^{n+\frac{1}{2}}. \end{aligned}$$

### thermal fluctuations

$$\begin{aligned} \langle \mathbf{g}^{n-\frac{1}{2}} \mathbf{g}^{n-\frac{1}{2}T} \rangle &= 4k_B T \Upsilon / \Delta t \\ \langle \mathbf{h}^n \mathbf{h}^{nT} \rangle &= 4k_B T \rho^{-2} \mu L / \Delta t. \end{aligned}$$

# MANGO-SELM Simulation Software



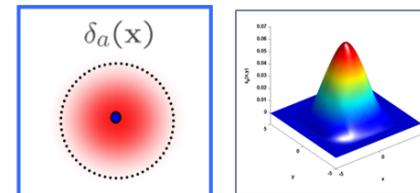
## SELM Coupling: adjoint condition

$$\langle \Gamma \mathbf{v}, \mathbf{F} \rangle = \sum_i [\Gamma \mathbf{v}]_i \cdot [\mathbf{F}]_i = \int_{\Omega} \mathbf{v}(\mathbf{x}) \cdot (\Lambda \mathbf{F})(\mathbf{x}) d\mathbf{x} = \langle \mathbf{v}, \Lambda \mathbf{F} \rangle$$

## IB-Kernel coupling:

$$\Gamma \mathbf{u} = \int_{\Omega} \eta(\mathbf{y} - \mathbf{X}(t)) \mathbf{u}(\mathbf{y}, t) d\mathbf{y}$$

$$\Lambda \mathbf{F} = \eta(\mathbf{x} - \mathbf{X}(t)) \mathbf{F}.$$



Peskin delta-function

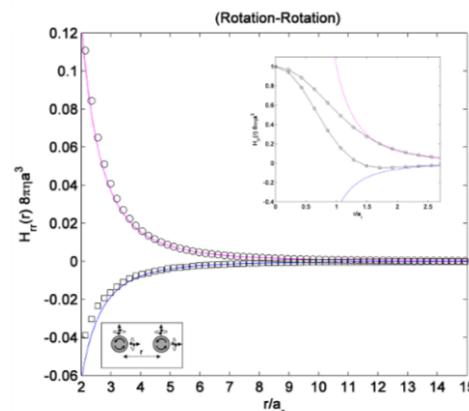
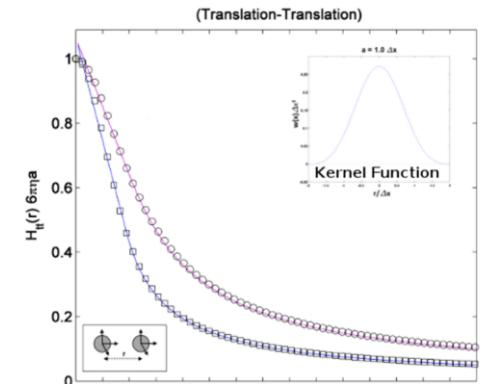
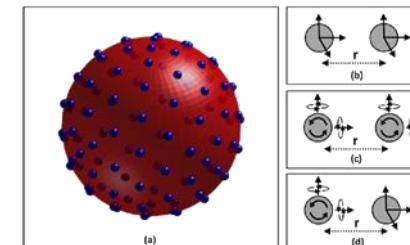
## Generalized Coupling (Faxen)

$$\Gamma_0 \mathbf{u} = \sum_m \left\langle \eta_0(\mathbf{y}_m - (\mathbf{X}_{cm} + \mathbf{z})) \mathbf{u}_m \right\rangle_{\tilde{\mathcal{S}}, |\mathbf{z}|=R} \Delta x_m^3$$

$$\Gamma_1 \mathbf{u} = \frac{3}{2R^2} \sum_m \left\langle \eta_1(\mathbf{y}_m - (\mathbf{X}_{cm} + \mathbf{z})) (\mathbf{z} \times \mathbf{u}_m) \right\rangle_{\tilde{\mathcal{S}}, |\mathbf{z}|=R} \Delta x_m^3.$$

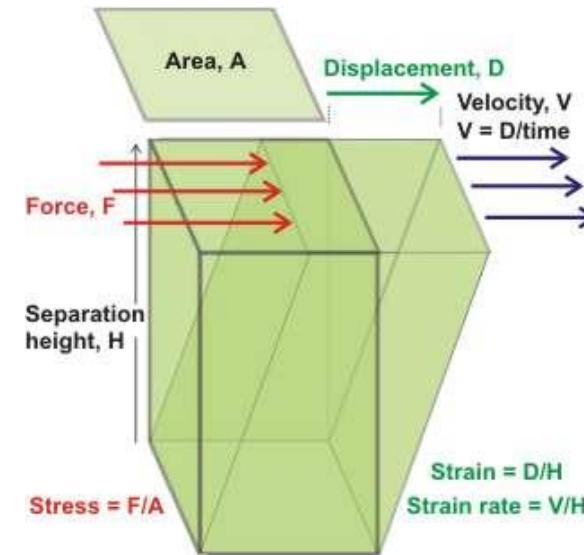
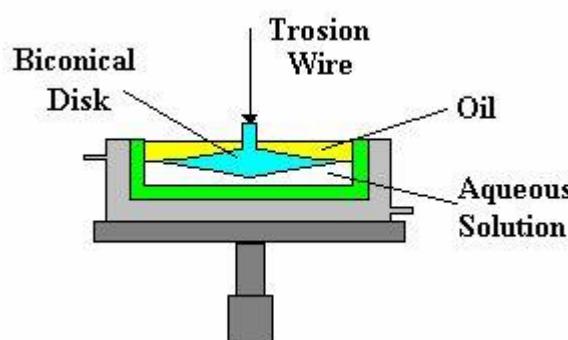
$$\Lambda_0(\mathbf{x}_m) = \left( \left\langle \eta_0(\mathbf{x}_m - (\mathbf{X}_{cm} + \mathbf{z})) \right\rangle_{\tilde{\mathcal{S}}, |\mathbf{z}|=R} \right) \mathbf{F}$$

$$\Lambda_1(\mathbf{x}_m) = -\frac{3}{2R^2} \left( \left\langle \mathbf{z} \eta_1(\mathbf{x}_m - (\mathbf{X}_{cm} + \mathbf{z})) \right\rangle_{\tilde{\mathcal{S}}, |\mathbf{z}|=R} \right) \times \mathbf{T}.$$



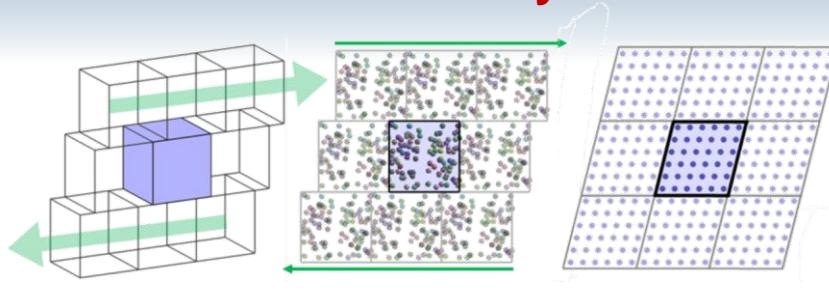
Atzberger 2011, Atzberger 2015

# Rheological Properties and Microstructure Dynamics

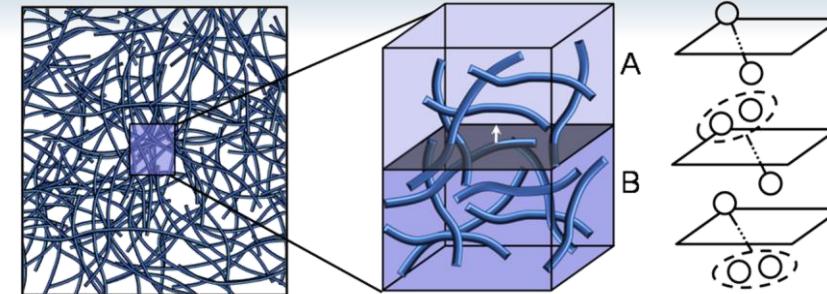


# MANGO-SELM Simulation Software

## Lees-Edwards Boundary Conditions:



## Material Stress ← Microscopic Forces



## Stress Tensor Estimator:

$$\sigma_{\ell,z}^{(n)} = \frac{1}{AL} \sum_{\mathbf{q} \in \mathcal{Q}_n} \sum_{j=1}^{n-1} \left\langle \mathbf{f}_{\mathbf{q},j}^{(\ell)} \cdot (\mathbf{x}_{q_n}^{*,(z)} - \mathbf{x}_{q_j}^{*,(z)}) \right\rangle$$

## Fluctuating hydrodynamics (moving frame):

$$\rho \frac{d\mathbf{w}}{dt} = L(t)\mathbf{w} + \lambda + \Lambda[-\nabla_{\mathbf{x}}\Phi] + (\nabla_{\mathbf{x}} \cdot \Lambda) k_B T + \mathbf{J} + \mathbf{h}_{\text{thm}}$$

$$S(t) \cdot \mathbf{w} = \mathbf{K}$$

$$\frac{d\mathbf{X}}{dt} = \Gamma \mathbf{w}.$$

$$S(t) \cdot \mathbf{w} = D \cdot \mathbf{w} + \mathbf{e}_z^T G \mathbf{w} \mathbf{e}_x \dot{\gamma} t$$

$$L(t)\mathbf{w} = \mu [\mathbf{e}_d - \delta_{d,3}\dot{\gamma}t\mathbf{e}_x]^T A \mathbf{w} [\mathbf{e}_d - \delta_{d,3}\dot{\gamma}t\mathbf{e}_x]$$

$$G(s,t) = \langle \mathbf{h}_{\text{thm}}(s) \mathbf{h}_{\text{thm}}(t)^T \rangle$$

$$G(s,t) = -2\wp(t)L(t)C\delta(t-s)$$

$$D \cdot \mathbf{w} = \sum_{d=1}^3 \frac{\mathbf{w}^{(d)}(\mathbf{q} + \mathbf{e}_d) - \mathbf{w}^{(d)}(\mathbf{q} - \mathbf{e}_d)}{2\Delta x}$$

$$[G\mathbf{w}]_{ij} = \frac{\mathbf{w}^{(i)}(\mathbf{q} + \mathbf{e}_j) - \mathbf{w}^{(i)}(\mathbf{q} - \mathbf{e}_j)}{2\Delta x}$$

$$[A\mathbf{w}]_{ii} = \frac{\mathbf{w}^{(i)}(\mathbf{q} + \mathbf{e}_i) - 2\mathbf{w}^{(i)}(\mathbf{q}) + \mathbf{w}^{(i)}(\mathbf{q} - \mathbf{e}_i)}{\Delta x^2}$$

$$[A\mathbf{w}]_{ij} = \frac{\mathbf{w}^{(d)}(\mathbf{q} + \mathbf{e}_i + \mathbf{e}_j) - \mathbf{w}^{(d)}(\mathbf{q} - \mathbf{e}_i + \mathbf{e}_j)}{4\Delta x^2} - \frac{\mathbf{w}^{(d)}(\mathbf{q} + \mathbf{e}_i - \mathbf{e}_j) - \mathbf{w}^{(d)}(\mathbf{q} - \mathbf{e}_i - \mathbf{e}_j)}{4\Delta x^2}, \quad i \neq j.$$

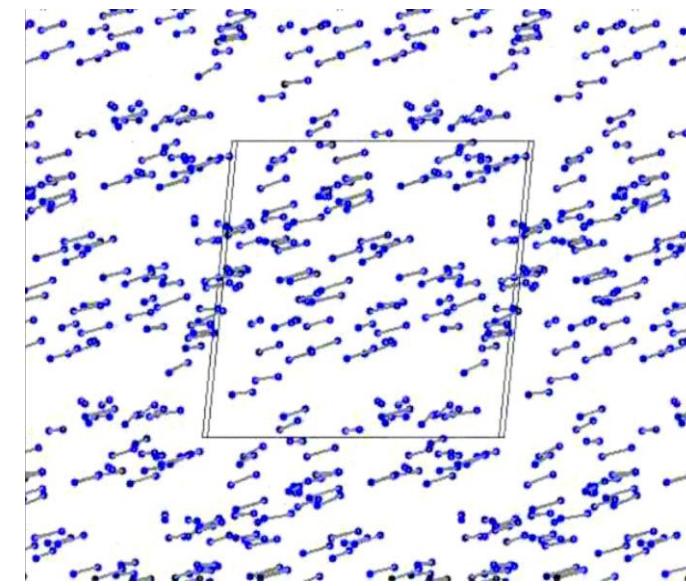
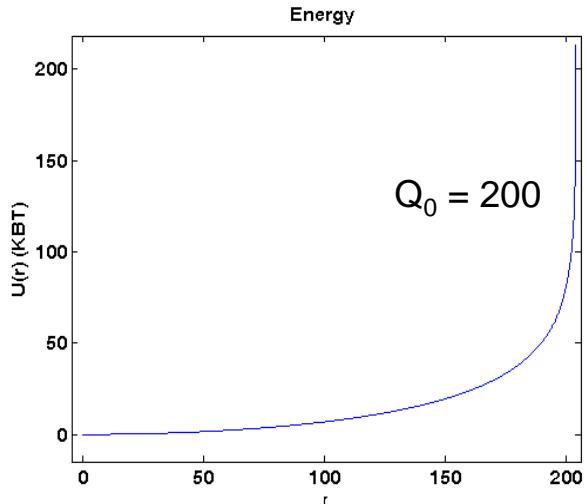
Atzberger 2013

# MANGO-SELM Simulation Software

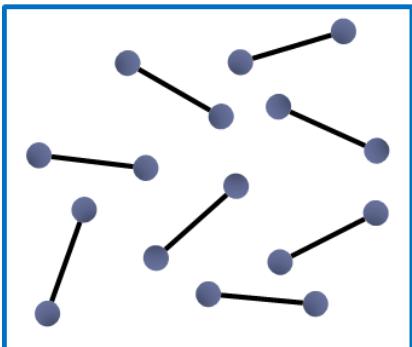
Example System : Finitely Extensible Nonlinear Elastic (FENE) Dimers:

Potential Energy:

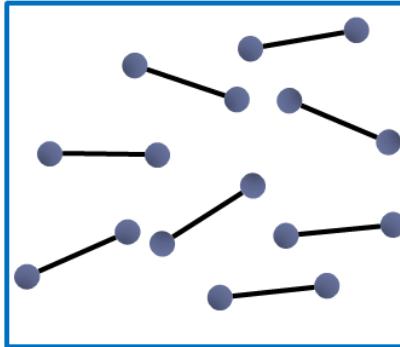
$$U(r) = -\frac{K}{2}Q_0^2 \log(1 - (Q/Q_0)^2)$$



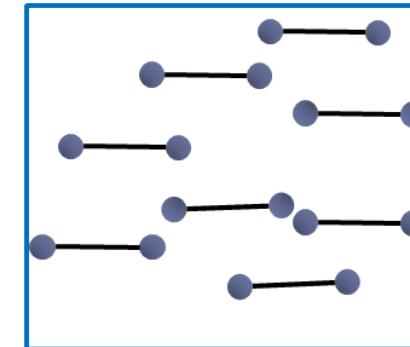
low shear rate



medium shear rate

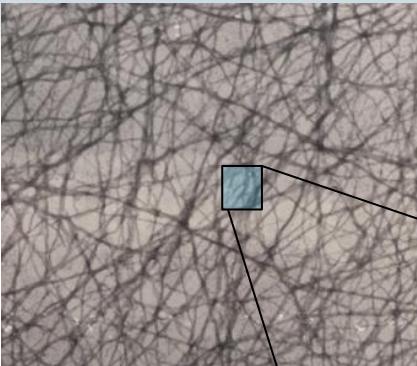


large shear rate



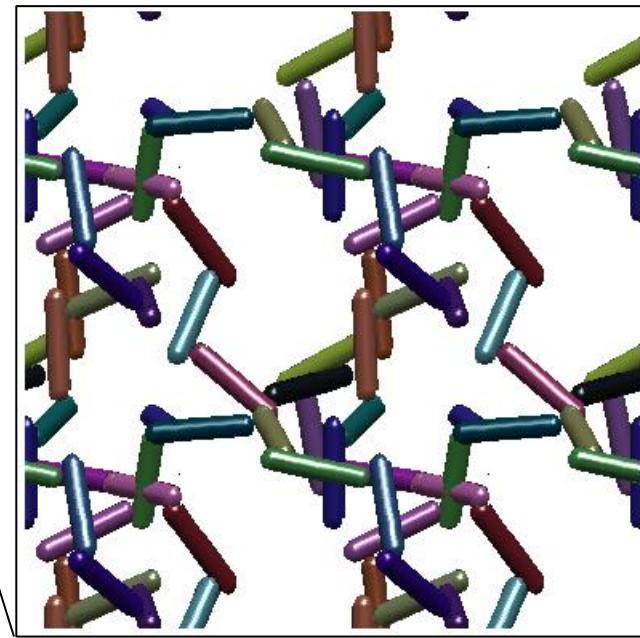
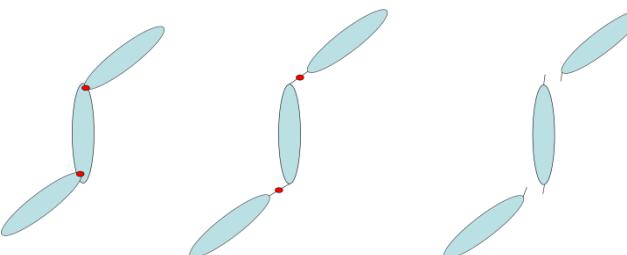
Atzberger 2013

# Gel-like Materials

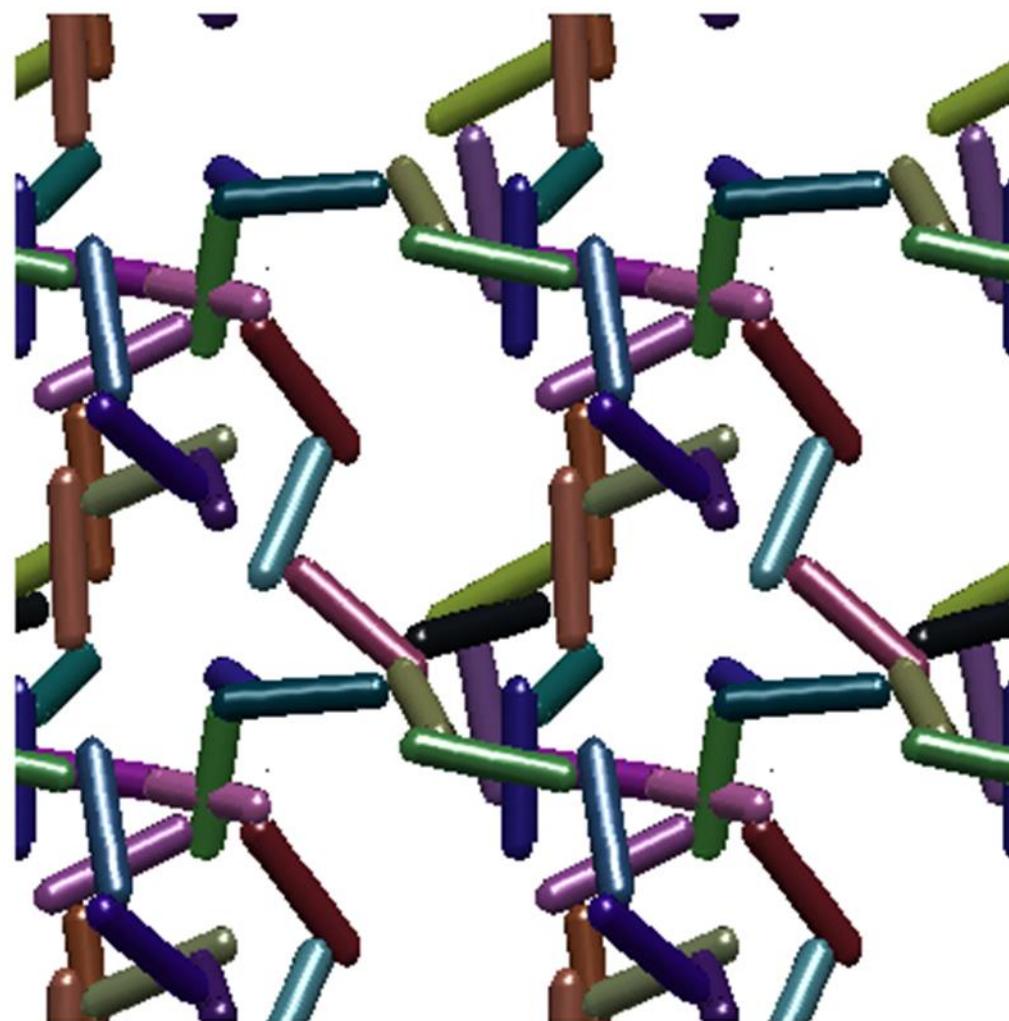


## Polymeric Gel Model:

- Worm-like chain elasticity for individual polymers.
- Near-end segments “sticky”.
- Branches bond angles are 70 degrees.
- Yield of “sticky” ends after 50% rest-length stretchi

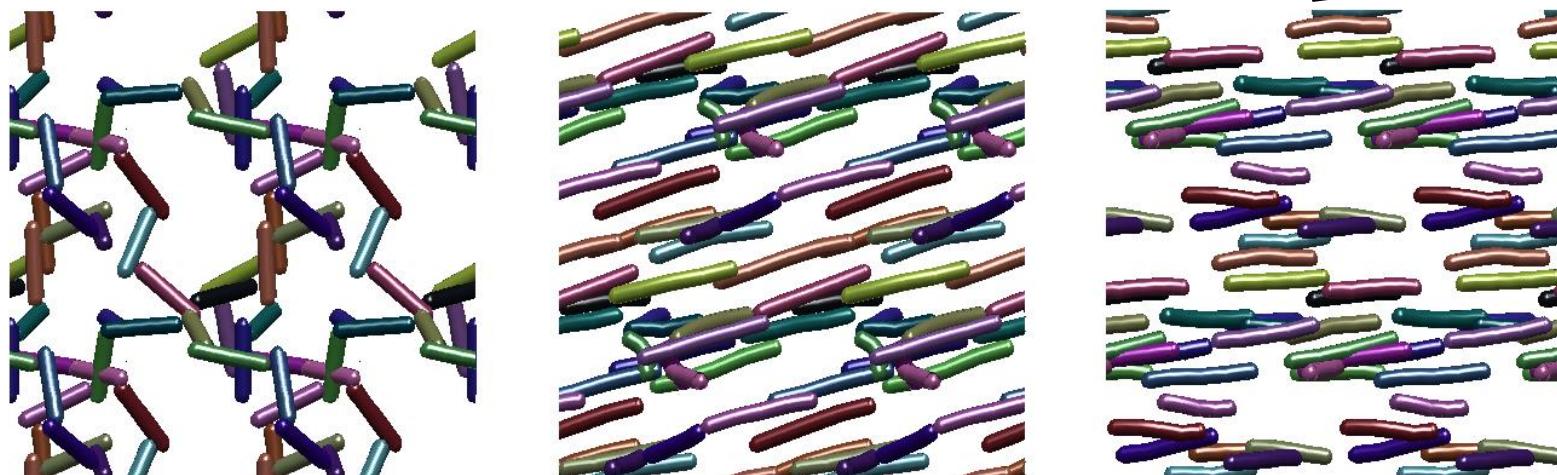
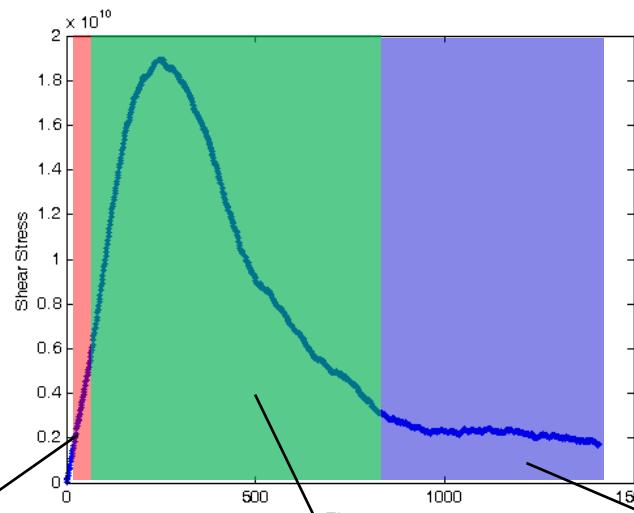


## Gel-like Materials



# Gel-like Materials

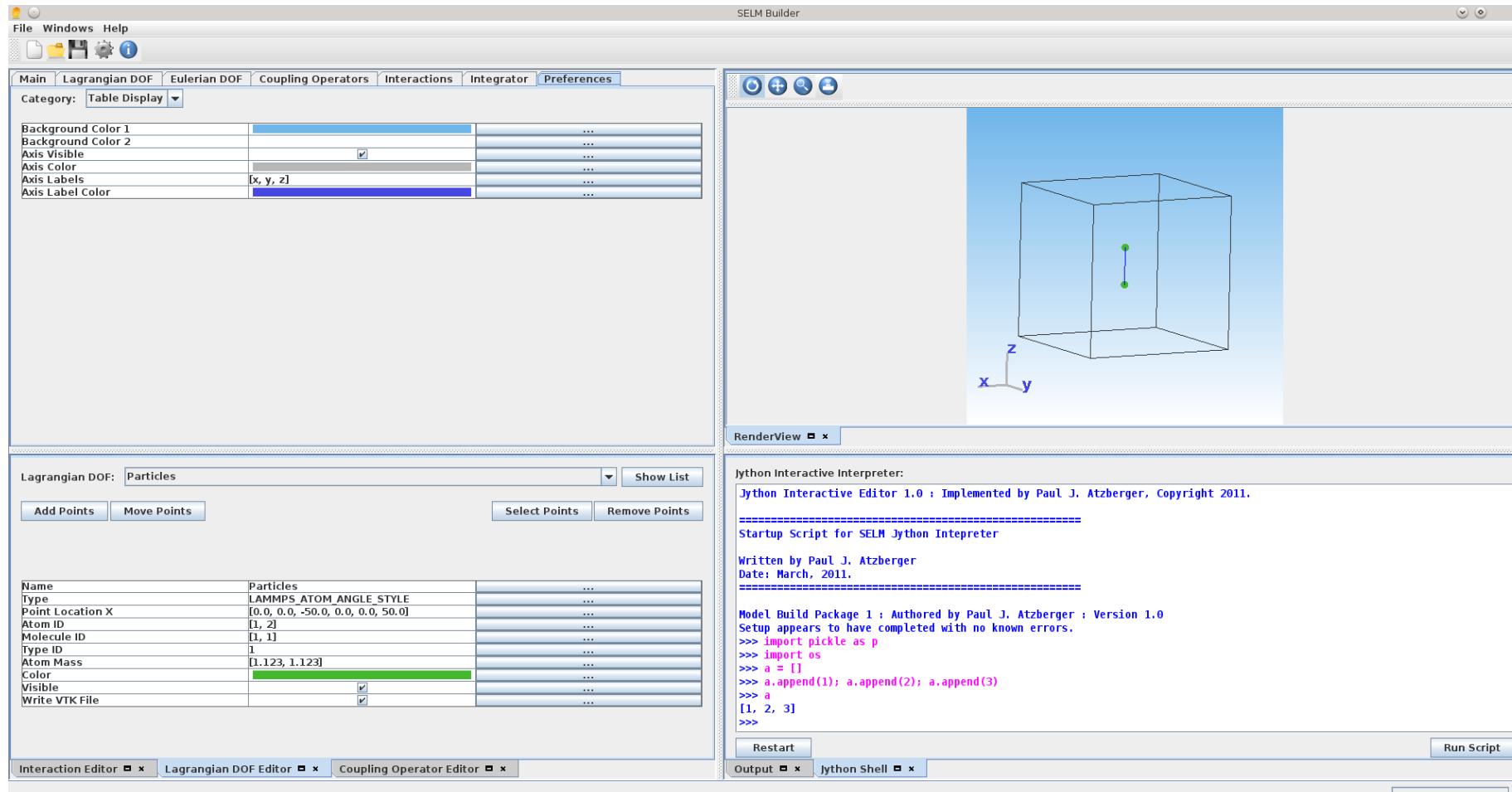
## Time Dependence of Shear Stress



# **Mango-Selm GUI (previous versions)**

# MANGO-SELM Simulation Software

## MANGO - Modeling Software:



# MANGO-SELM Simulation Software

MANGO-SELM – Download: <http://mango-selm.org/>

## Mango-Selm | Fluctuating Hydrodynamics

[Home](#)

[Downloads](#)

[Screenshots](#)

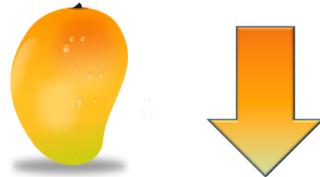
[Gallery](#)

[Documentation](#)

[Developers](#)

[Forum](#)

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### Downloads

Please join our [mailing list](#) for the announcement of updated releases.

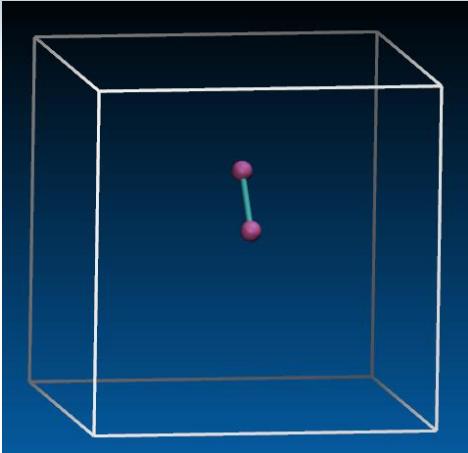
- [Download Latest Release](#)

### Additional Information

- [Installation Instructions](#)
- [Tutorials for Setting up Simulations](#)
- [Mango-Selm Announcements](#)
- [Mango-Selm Discussion Forum](#)
- [Mango-Selm Issue Tracker](#)

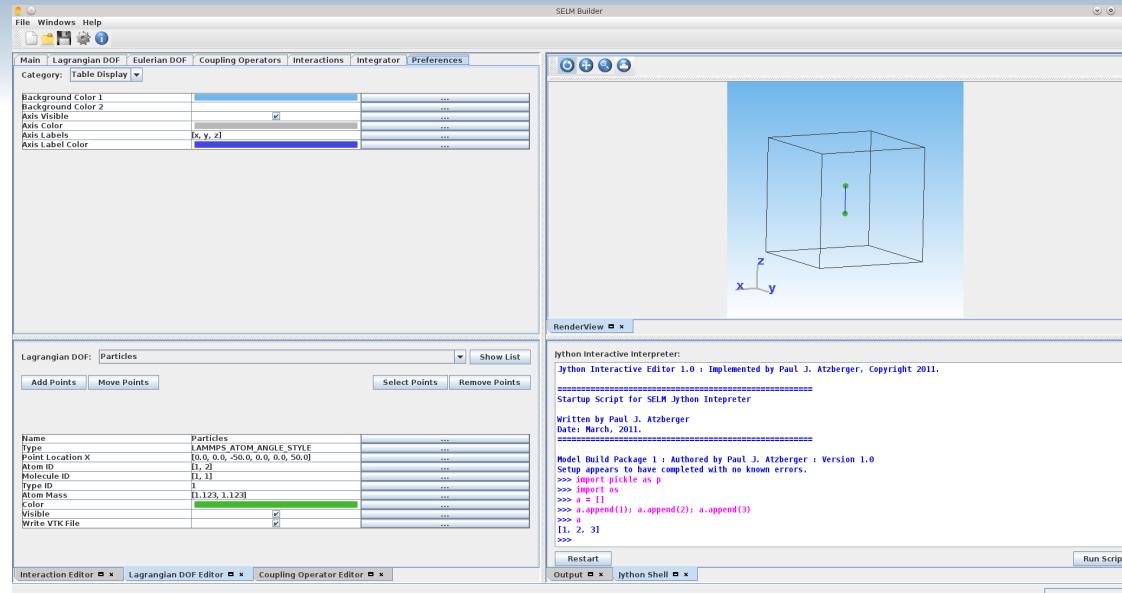
# MANGO-SELM Simulation Software

## Demo Live: FENE\_Dimer



### Steps:

1. Use File → Open project.  
FeneTest1/FeneModel.SELM\_Builder\_Project
2. Load:  
FeneTest1/FeneModel.SELM\_Builder\_Project
3. Adjust coupling operator table to  
/common/CouplingOp\_T\_KERNEL\_1.SELM\_CouplingOperator\_weightTable
4. Gear Icon → generate SELM simulation files.
5. Link executable in ln -s ..//common/  
SELM\_LAMMPS\_2.0.0a\_serial\_x86\_Ubuntu run
6. run -in Fene\_Dimer.LAMMPS\_script
7. Generates output data → .dcd file.
8. Run ./vis\_FENE.vmd to visualize the model.

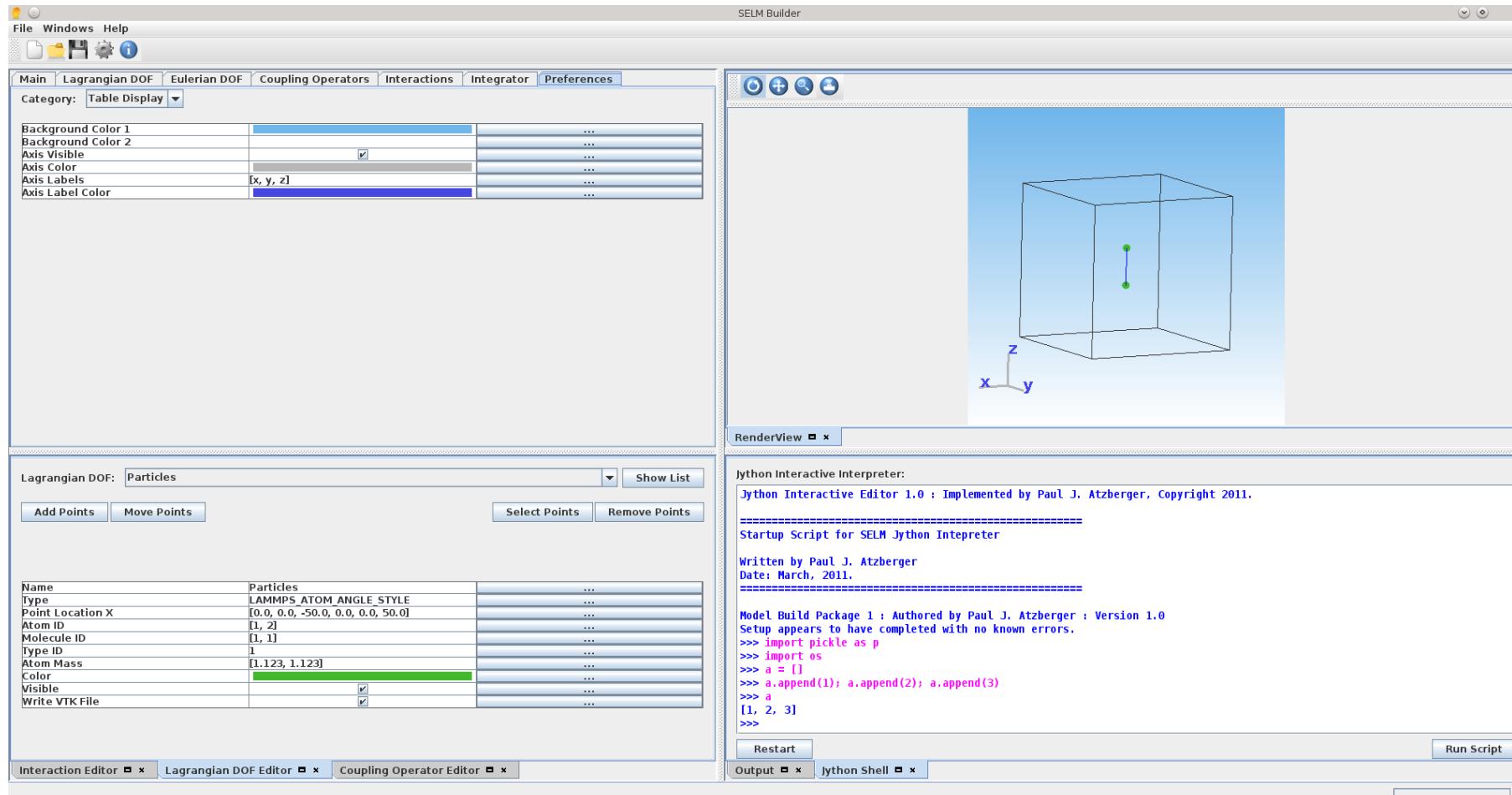


### Important files:

FENE\_Dimer.LAMMPS\_script  
FENE\_Dimer.LAMMPS\_read\_data  
FENE\_Dimer.SELM\_Info  
FENE\_Dimer.SELM\_InfoExtra  
FENE\_Dimer.SELM\_params  
FENE-bonds.SELM\_Interaction  
  
CouplingOp.SELM\_CouplingOperator  
CouplingOp\_T\_KERNEL\_1.SELM\_CouplingOperator\_weightTable  
  
LAMMPS\_SHEAR\_QUASI\_STEADY1\_FFTW3.SELM\_Integrator  
LAMMPS\_SHEAR\_UNIFORM1\_FFTW3.SELM\_Eulerian  
Particles.SELM\_Lagrangian  
  
SELM\_LAMMPS\_serial\_x86\_Ubuntu  
\*.dcd  
vis1.vmd

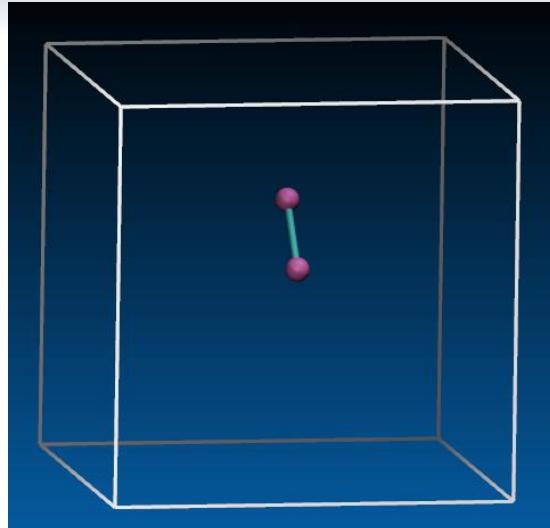
# MANGO-SELM Simulation Software

## Demo Live: FENE

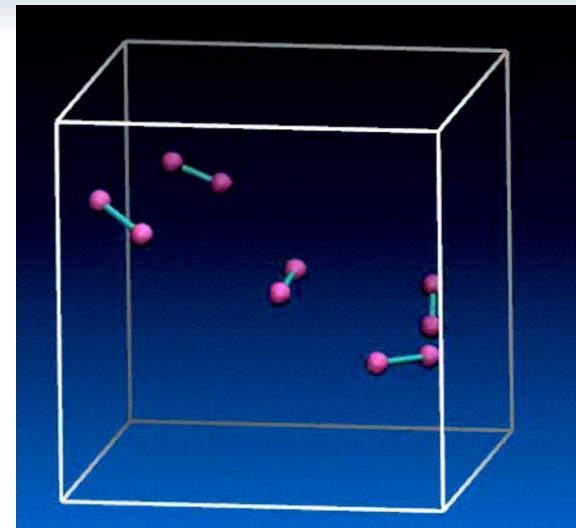


# MANGO-SELM Simulation Software

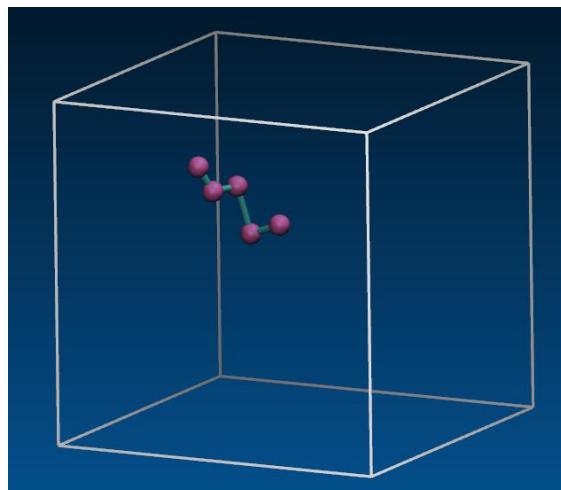
Other Demos:



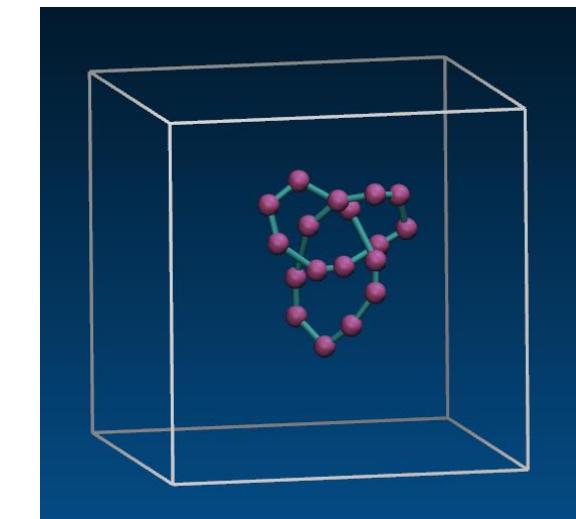
Sheared FENE Dimer



FENE Fluid



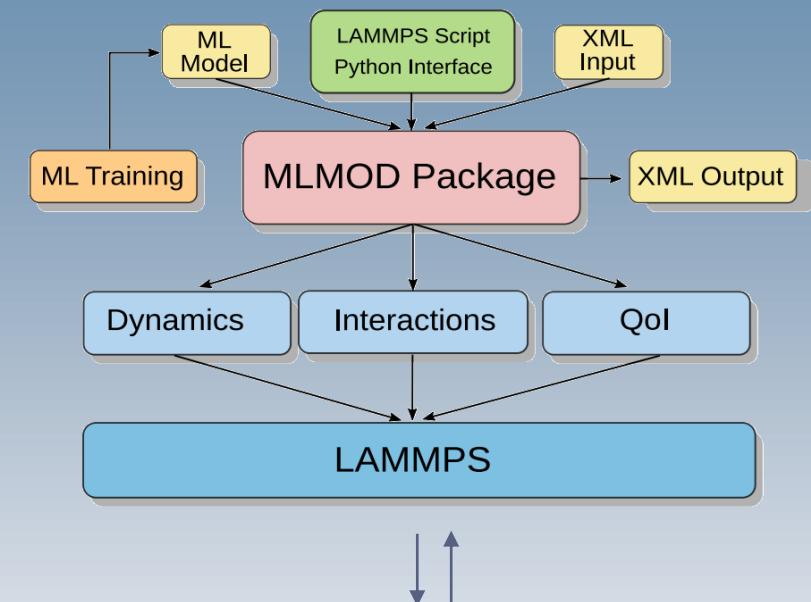
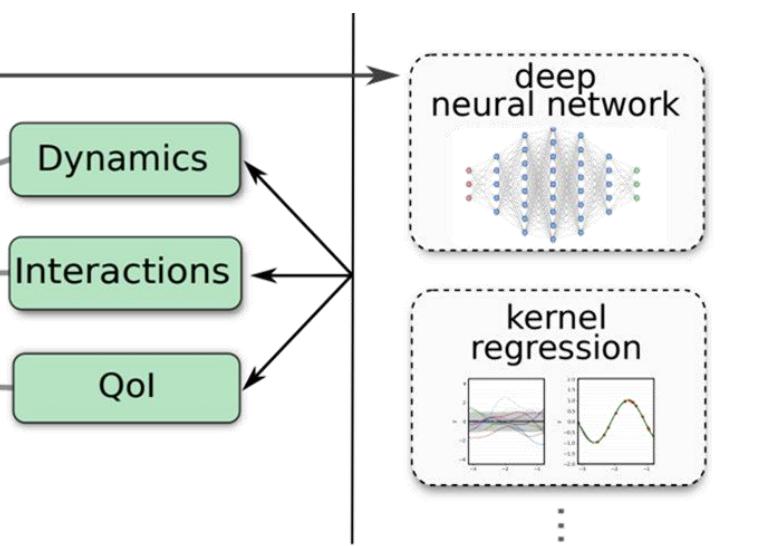
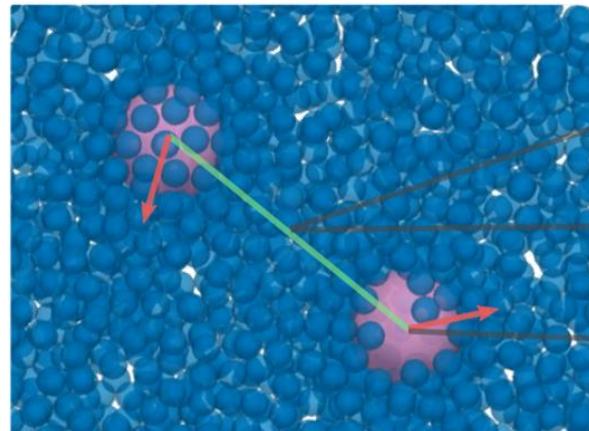
Polymer Chain



Polymer Knot

# **MLMOD Package**

# MLMOD Package: Machine Learning Methods for Data-Driven Modeling



LAMMPS Workshop  
August 2021

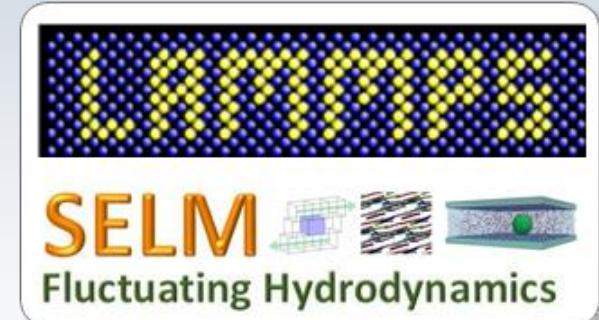
**Paul J. Atzberger**  
University of California Santa Barbara



DOE ASCR PhilMS  
DE-SC0019246



NSF Grant  
DMS - 1616353



<http://software.atzberger.org>  
paper: <https://arxiv.org/abs/2107.14362>

# MLMOD Package: Data-Driven Modeling

## Software

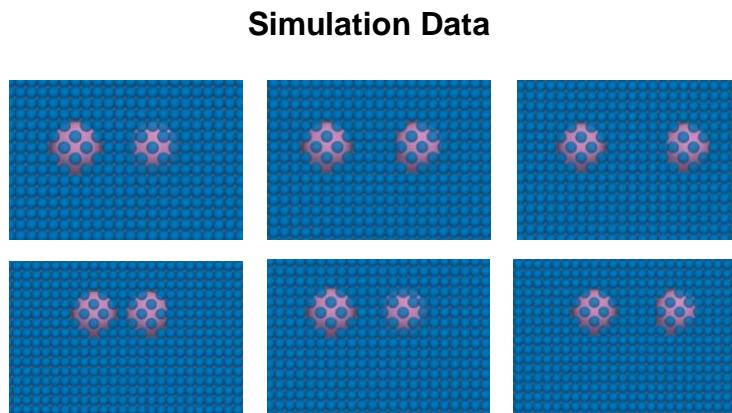
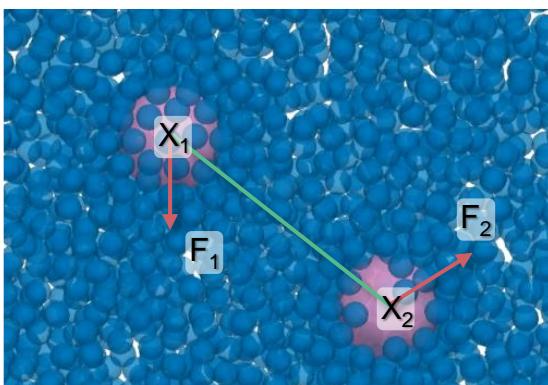
### MLMOD Machine Learning Modeling Package



<http://software.atzberger.org>  
paper: <https://arxiv.org/abs/2107.14362>

## Example use case

### Colloid + Solvent System



### Simulation Data

DOE ASCR PhilMS DE-SC0019246

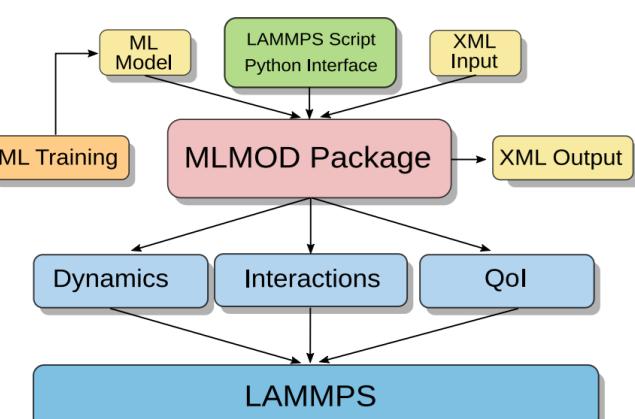


NSF Grant  
DMS - 1616353

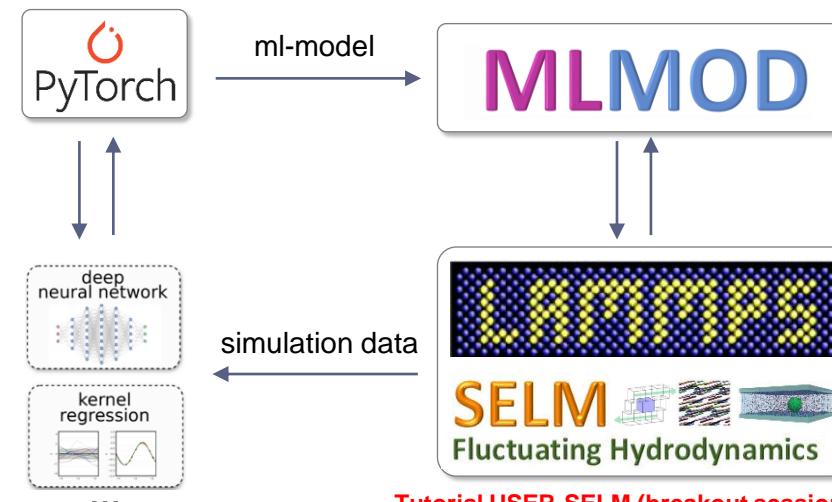
**More Information:**  
<http://software.atzberger.org>

<http://atzberger.org/>

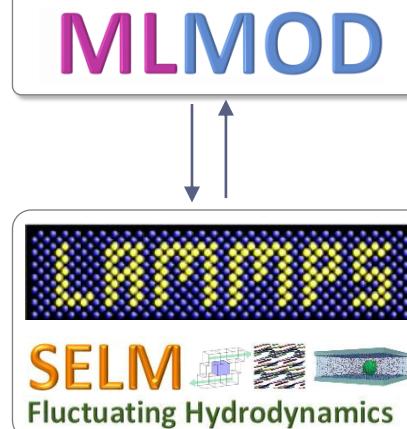
## Package Structure



## Machine Learning (training)



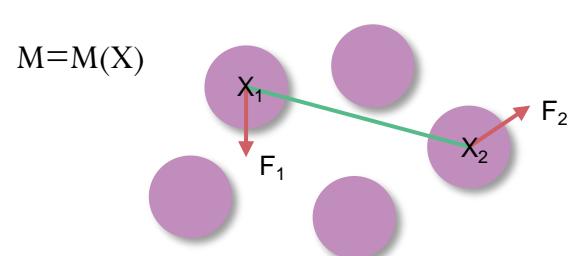
## Scientific Computation (simulation)



Tutorial USER-SELM (breakout session)  
Friday, 8/13, 12:50pm EDT

## Reduced Model

$$\frac{d\mathbf{X}}{dt} = \mathbf{MF} + k_B T \nabla_{\mathbf{X}} \cdot \mathbf{M} + \mathbf{F}_{thm} \quad |$$
$$\langle \mathbf{F}_{thm}(s) \mathbf{F}_{thm}(t)^T \rangle = 2k_B T \mathbf{M} \delta(t - s).$$



paper: <https://arxiv.org/abs/2107.14362>

# Summary / Conclusions

# Conclusions



B. Gross



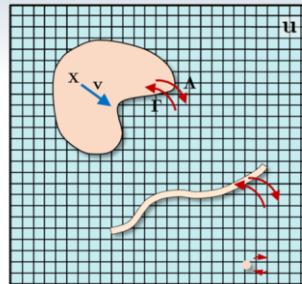
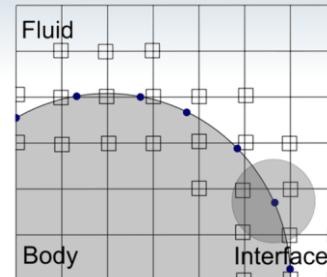
D. Rower



M. Padidar  
UCSB Recent Student  
Collaborators



J. Sigurdsson



175

Paper  
2016 Atzberger & Sigurdsson

## Summary

**Stochastic Immersed Boundary Methods** with numerical solvers preserving statistical mechanics properties.

**Stochastic Eulerian Lagrangian Methods** for inertial and overdamped regimes, various boundary conditions.

**Python interface** for setting up simulations, **LAMMPS molecular dynamics integration** (modeling, analysis).

**Applications** in soft materials, complex fluids, rheology, microfluidics, biophysics, lipid bilayer membranes.

## Papers

**A Stochastic Immersed Boundary Method for Fluid-Structure Dynamics at Microscopic Length Scales,**

P.J. Atzberger, P.R. Kramer, and C.S. Peskin, J. Comp. Phys., Vol. 224, Iss. 2, (2007).

**Stochastic Eulerian Lagrangian Methods for Fluid Structure Interactions with Thermal Fluctuations,**

P.J. Atzberger, J. of Comp. Phys., 230, pp. 2821--2837, (2011).

**Surface Fluctuating Hydrodynamics Methods for the Drift-Diffusion Dynamics of Particles and Microstructures within Curved Fluid Interfaces,**

D. Rower, M. Padidar, and P. J. Atzberger, arXiv:1906.01146, (2019).

**Meshfree Methods on Manifolds for Hydrodynamic Flows on Curved Surfaces: A Generalized Moving Least-Squares (GMLS) Approach,**

Gross B. J., Kuberry P. A., Trask N., Atzberger P. J., J. Comp. Phys., 409, 15 May (2020).

## UCSB Recent Student Collaborators

B. Gross, M. Padidar, D. Rower, J. K. Sigurdsson.

## Sandia Collaborators

N. Trask, P. Kuberry, J. Hu, C. Siefert, and others.

## Funding



DOE ASCR CM4  
DE-SC0009254



DOE ASCR PhilMS  
DE-SC0019246



NSF Grant  
DMS - 1616353



NSF CAREER Grant  
DMS-0956210

More information: <http://atzberger.org/>

# Publications

**A Stochastic Immersed Boundary Method for Fluid-Structure Dynamics at Microscopic Length Scales,**  
P.J. Atzberger, P.R. Kramer, and C.S. Peskin, J. Comp. Phys., Vol. 224, Iss. 2, (2007). <http://dx.doi.org/10.1016/j.jcp.2006.11.015>

**Stochastic Eulerian Lagrangian Methods for Fluid Structure Interactions with Thermal Fluctuations,**  
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**Fluctuating Hydrodynamics Methods for Dynamic Coarse-Grained Implicit-Solvent Simulations in LAMMPS**, Y. Wang, J. K. Sigurdsson, and P.J. Atzberger, SIAM J. Sci. Comp. (accepted), (2016). <https://doi.org/10.1137/15M1026390>

**MLMOD Package: Machine Learning Methods for Data-Driven Modeling in LAMMPS**, P.J. Atzberger, arXiv (2021), <https://arxiv.org/abs/2107.14362>.

**Surface Fluctuating Hydrodynamics Methods for the Drift-Diffusion Dynamics of Particles and Microstructures within Curved Fluid Interfaces**,  
D. Rower, M. Padidar, and P. J. Atzberger, arXiv:1906.01146, (2019). <https://arxiv.org/abs/1906.01146>

**Meshfree Methods on Manifolds for Hydrodynamic Flows on Curved Surfaces: A Generalized Moving Least-Squares (GMLS) Approach**,  
Gross B. J., Kuberry P. A., Trask N., Atzberger P. J., J. Comp. Phys., 409, 15 May (2020). <https://doi.org/10.1016/j.jcp.2020.109340>

**Systematic Stochastic Reduction of Inertial Fluid-Structure Interactions subject to Thermal Fluctuations**, G. Tabak and P.J. Atzberger, SIAM J. Appl. Math., 75(4), 1884–1914, (2015). <http://dx.doi.org/10.1137/15M1019088>

**Dynamic Implicit-Solvent Coarse-Grained Models of Lipid Bilayer Membranes : Fluctuating Hydrodynamics Thermostat**, Y. Wang, J. K. Sigurdsson, E. Brandt, and P.J. Atzberger, Phys. Rev. E 88, 023301, (2013). <http://dx.doi.org/10.1103/PhysRevE.88.023301>

**Spatially Adaptive Stochastic Methods for Fluid-Structure Interactions Subject to Thermal Fluctuations in Domains with Complex Geometries**,  
P. Plunkett, J. Hu, C. Siefert, P.J. Atzberger, Journal of Computational Physics, Vol. 277, 15 Nov. 2014, pg. 121--137, (2014).  
<http://dx.doi.org/10.1016/j.jcp.2014.07.051>

**Incorporating Shear into Stochastic Eulerian Lagrangian Methods for Rheological Studies of Complex Fluids and Soft Materials**,  
P.J. Atzberger, Physica D, Vol. 265, pg. 57–70, (2013). <http://dx.doi.org/10.1016/j.physd.2013.09.002>

For additional information: <http://atzberger.org/>

