



# Molecular Structure at an Interface

By Edward Smith

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Collaborators: David Heyes, Daniele Dini, Omar Matar, Carlos Braga,  
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Students/Postdocs: Alessio Lavino, Eduardo Ramos-Fernandez, David Trevelyan

# Brunel University London



Brunel Centre for Advanced  
Solidification Technology

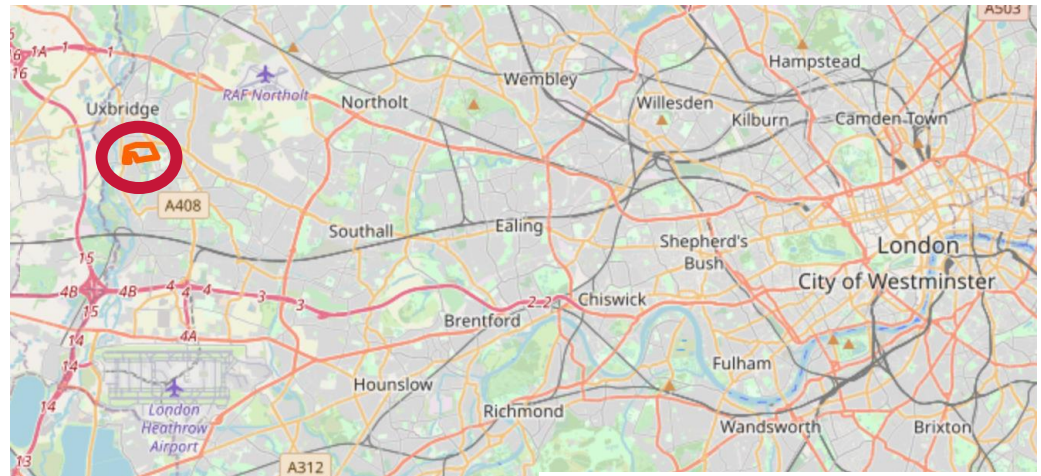


*Experimental  
Techniques  
Centre*

A Research-Focused Engineering University

## Continuum Methods

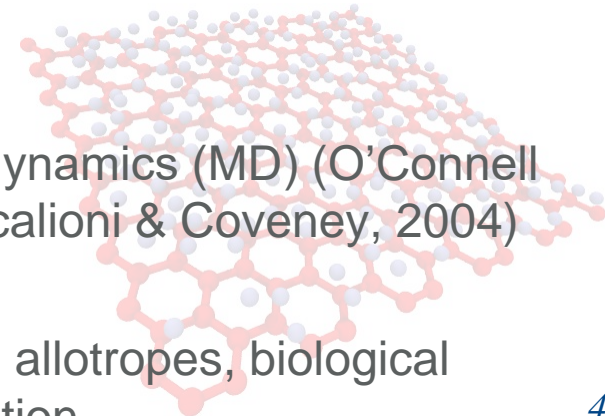
Classical Molecular  
Quantum



- **Molecular Structure at the Interface**
  - A local region containing molecular detail
  - Coupling to a (cheaper) model for the remaining domain
- **A Coupling Framework**
  - Eulerian control volumes and molecular stress
  - Extension to general interfaces
- **Some Examples of Coupled Interfaces**
  - Using molecular detail at the interface
  - Limits of the classical picture

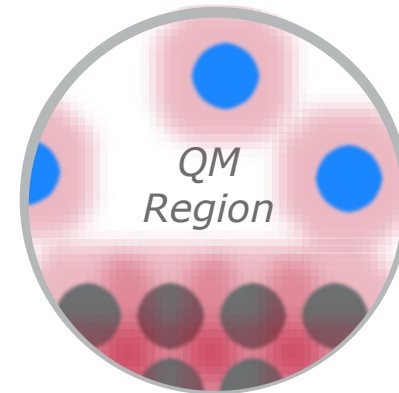
# Motivation

- Modern engineering problems require sub-continuum models
  - Quantum mechanics is limited to very small systems
  - Even molecular dynamics is prohibitively expensive
  - Multi-scale coupling overcomes these limitations by linking to cheaper methods
- Multi-scale coupling has been employed since the 1970's (Curtin & Miller 2003) in solid mechanics modelling (*e.g.* for crack tips)
  - Essential to capture detail in the crack itself and the impact on the wider system
  - Continuum  $\leftrightarrow$  Molecular mechanics (MM)  $\leftrightarrow$  Quantum mechanics (QM)
- Classical coupling for fluids is less mature
  - Computational fluid dynamics (CFD)  $\leftrightarrow$  Molecular dynamics (MD) (O'Connell & Thompson 1995, Flekkøy et al 2000, Delgado-Buscalioni & Coveney, 2004)
  - Linking CFD  $\leftrightarrow$  MD  $\leftrightarrow$  QM is a natural next step
  - Important for *e.g.* nucleation events, flow over carbon allotropes, biological systems, electronics, chemical reactions and combustion



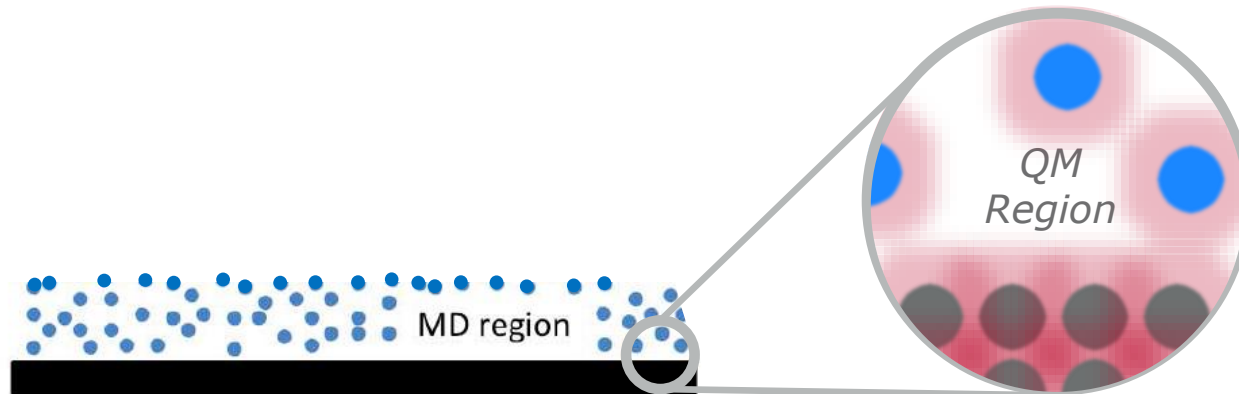
# Motivation

- Long term goal is to seamlessly link various scales of modelling
  - Fine/coarse graining as required based on the problem of interest
  - Dynamic resource allocation and load balancing on multi-core architectures



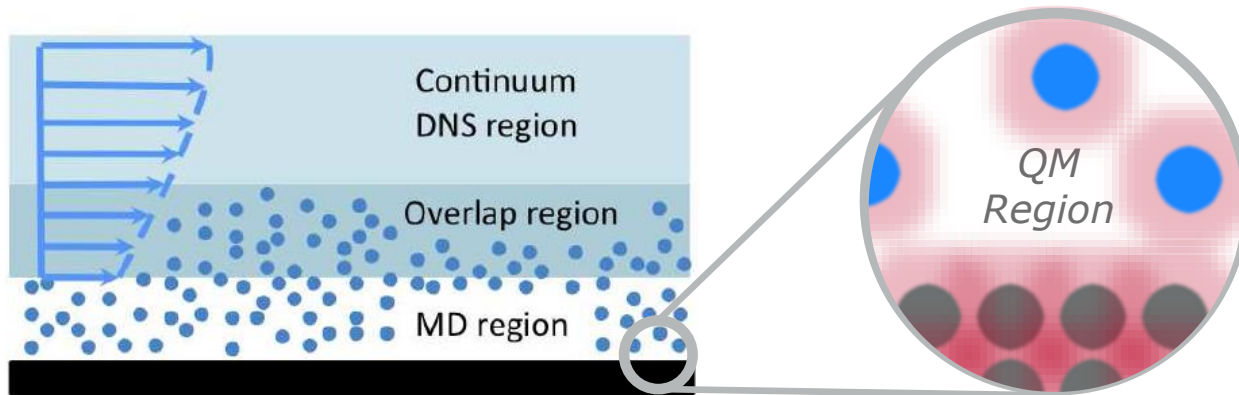
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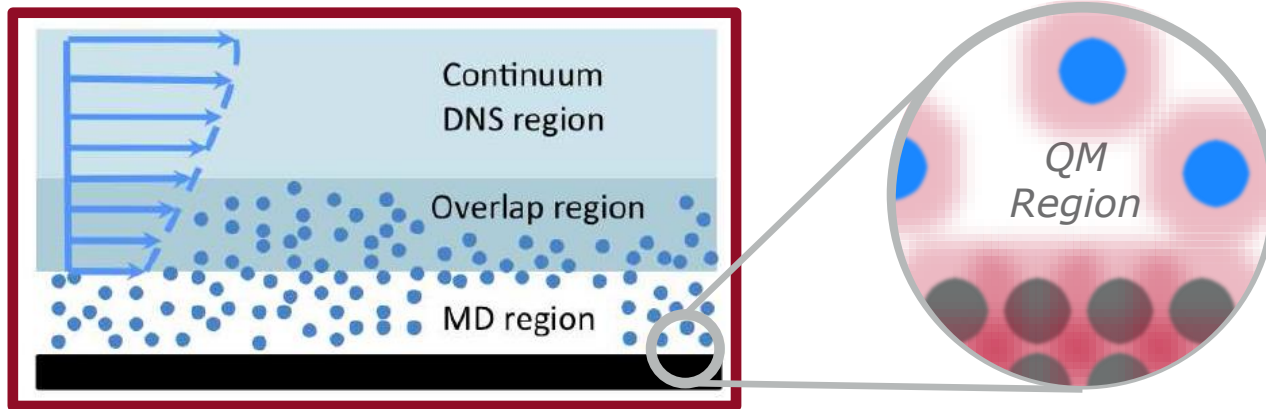
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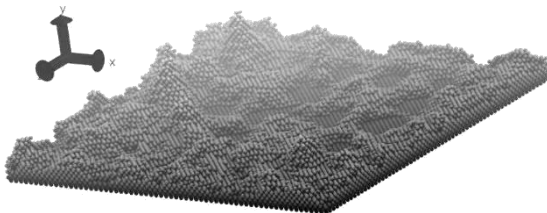


# Motivation

- Long term goal is to seamlessly link various scales of modelling
  - Fine/coarse graining as required based on the problem of interest
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- Reduce the problem to one of modelling the interface with molecules
  - The material surface covered in liquid OR a liquid-vapour interface

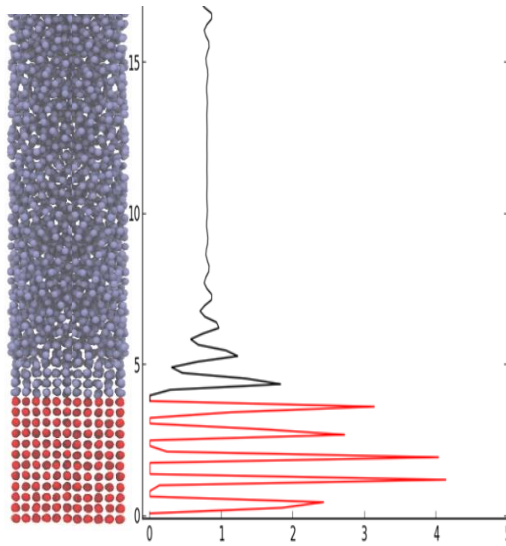




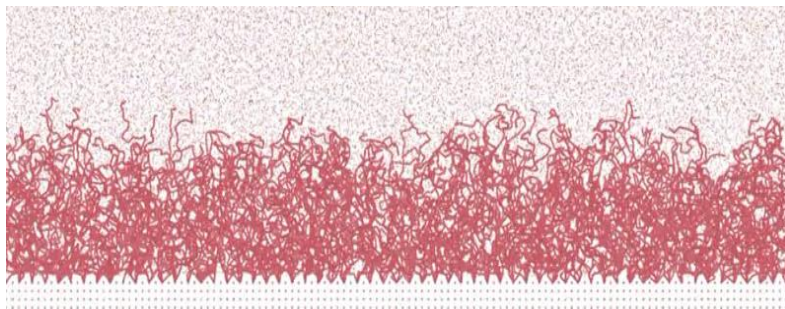
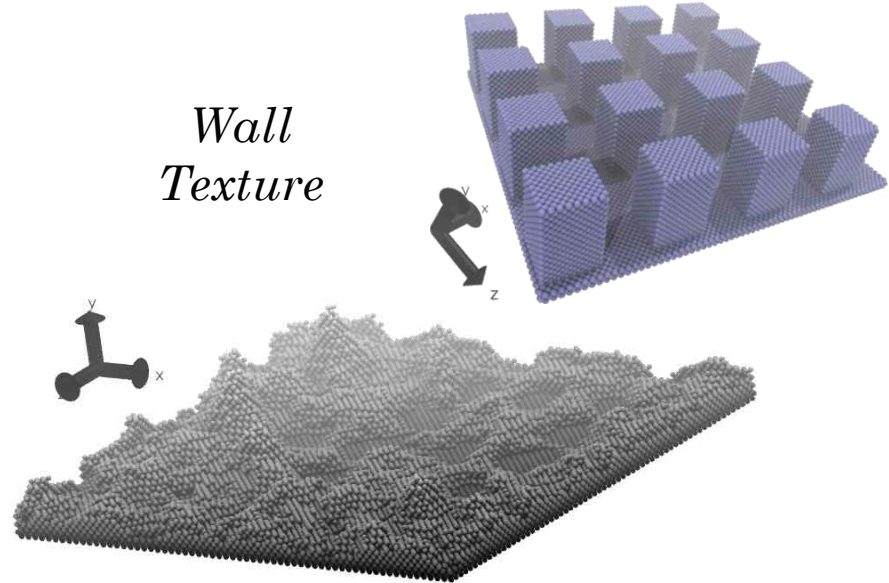
# Solid-Liquid Interfaces

*Liquid structure causes viscosity*

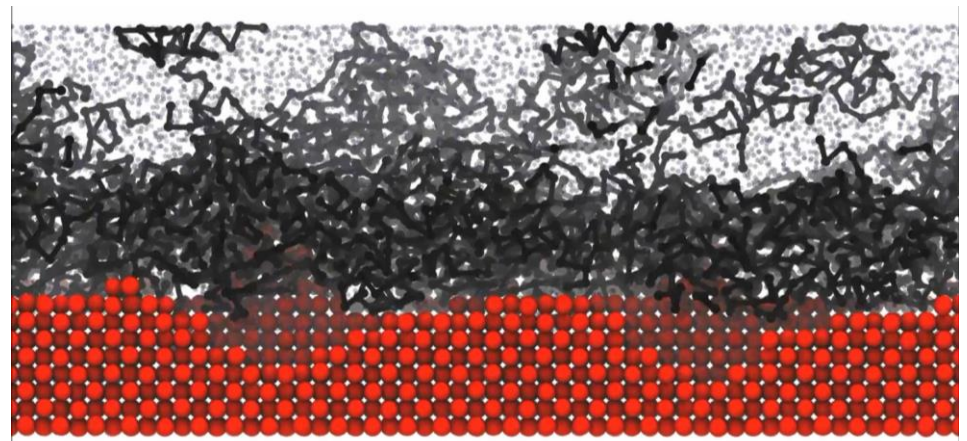
*Stick-slip near walls*



*Wall Texture*



*Polymer Brushes/Coating*



*Oil, water and textured surface*

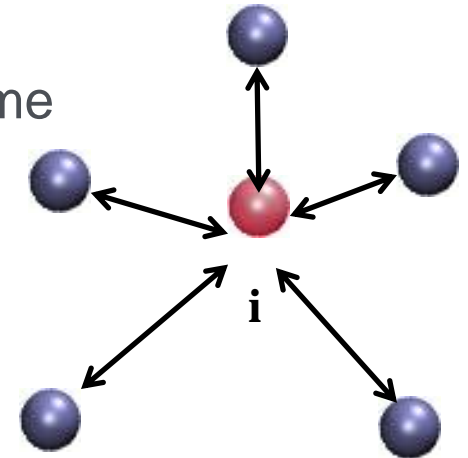
# Classical Molecular Dynamics

## Discrete molecules in continuous space

- Molecular position evolves continuously in time
- Position and velocity from acceleration

$$\ddot{\mathbf{r}}_i \rightarrow \dot{\mathbf{r}}_i$$

$$\dot{\mathbf{r}}_i \rightarrow \mathbf{r}_i(t)$$

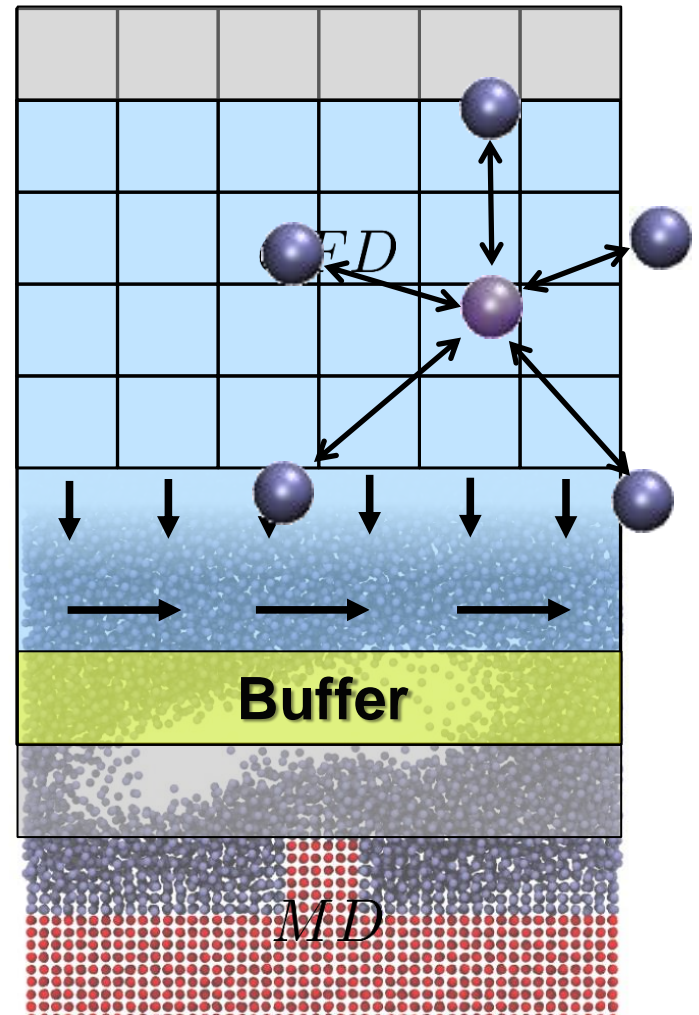


## Acceleration obtained from classical forces

- Newton's law for an N-body system in own solver called "Flowmol"
- Point particles Lennard-Jones interactions (SAFT  $\gamma$  Mie extension)

$$m_i \ddot{\mathbf{r}}_i = \mathbf{F}_i = \sum_{i \neq j}^N \mathbf{f}_{ij} = \sum_{i \neq j}^N \nabla \Phi_{ij} \quad \Phi(r_{ij}) = 4\epsilon \left[ \left( \frac{\ell}{r_{ij}} \right)^{12} - \left( \frac{\ell}{r_{ij}} \right)^6 \right]$$

# Coupled To Continuum Equations



# Coupled To Continuum Equations

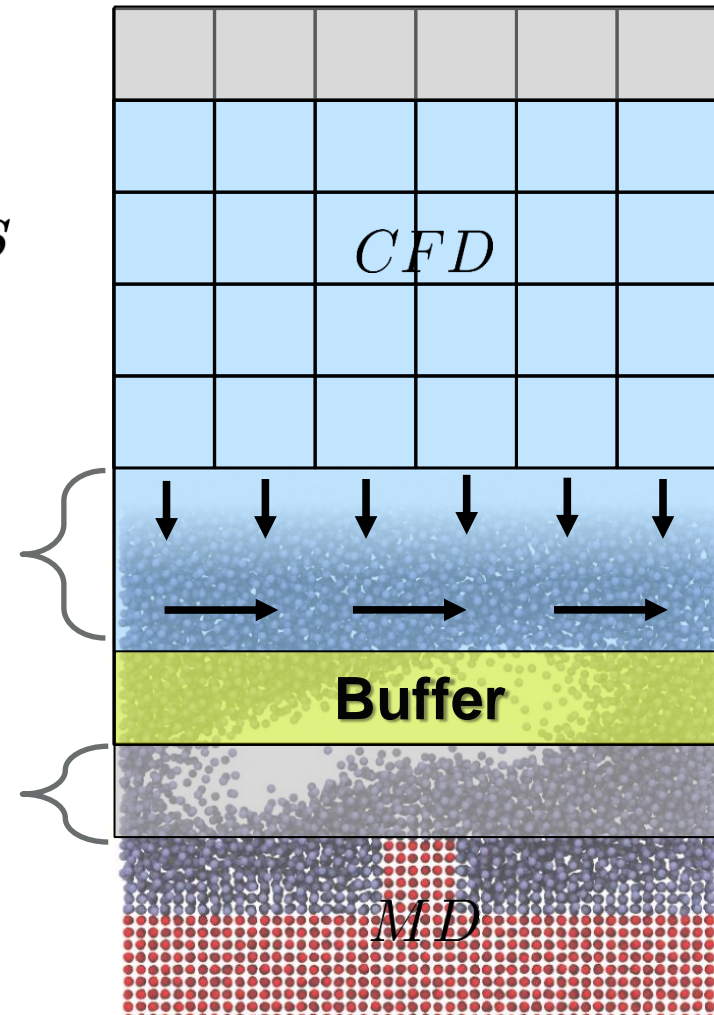
- Computational Fluid Dynamics

$$\frac{\partial}{\partial t} \int_V \rho u dV = - \oint_S \rho u u \cdot d\mathbf{S} - \oint_S \mathbf{P} \cdot d\mathbf{S}$$

- No Hamiltonian, use Newton's law

**CFD→MD**  
Boundary  
condition

**MD→CFD**  
Boundary  
condition





# A Coupling Framework

- Continuum Region, density at a point

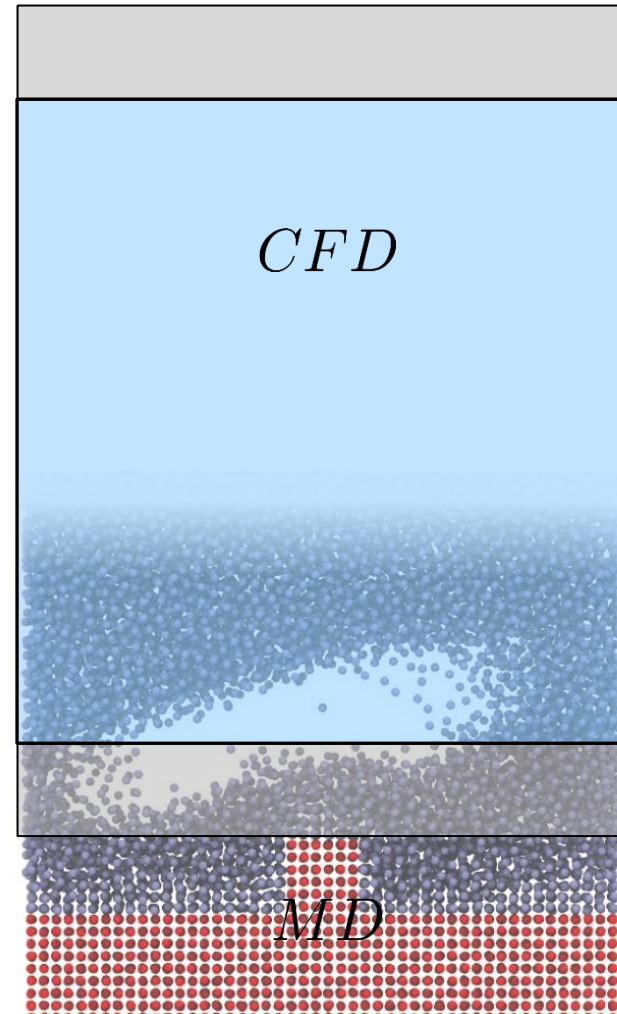
$$\rho(\mathbf{r}, t)$$

Share the same  
**time** and **length**  
scales

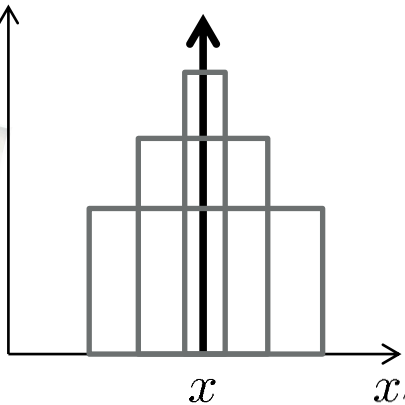
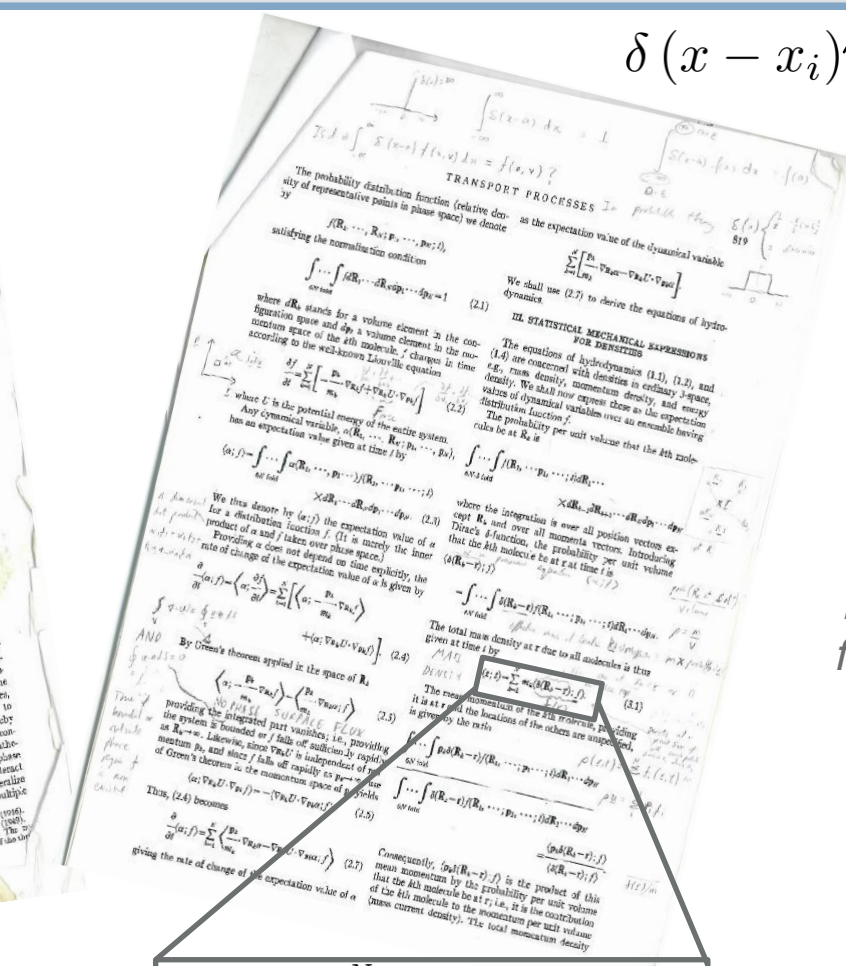


- Discrete molecules

$$m_i \text{ for all } i \text{ in } N$$



# Irving and Kirkwood (1950)



The Dirac delta infinitely high, infinitely thin peak formally equivalent to the continuum differential formulation

$$\rho(\mathbf{r}, t) = \sum_{i=1}^N \left\langle m_i \delta(\mathbf{r} - \mathbf{r}_i); f \right\rangle$$



## The Control Volume (Weak) Form

- The “weak formulation” expresses the equations in integrated form

$$\int_V \rho(\mathbf{r}, t) dV = \sum_{i=1}^N m_i \int_V \delta(\mathbf{r} - \mathbf{r}_i) dV$$

- Integrating the Dirac delta function exactly provides a combination of Heaviside functions
- This turns out to have some nice properties

# The Control Volume Functional

- The Control volume functional is the formal integral of the Dirac delta functional in 3 dimensions (3D top hat or box car function)

$$\vartheta_i \equiv \int_{x^-}^{x^+} \int_{y^-}^{y^+} \int_{z^-}^{z^+} \delta(x_i - x) \delta(y_i - y) \delta(z_i - z) dx dy dz$$

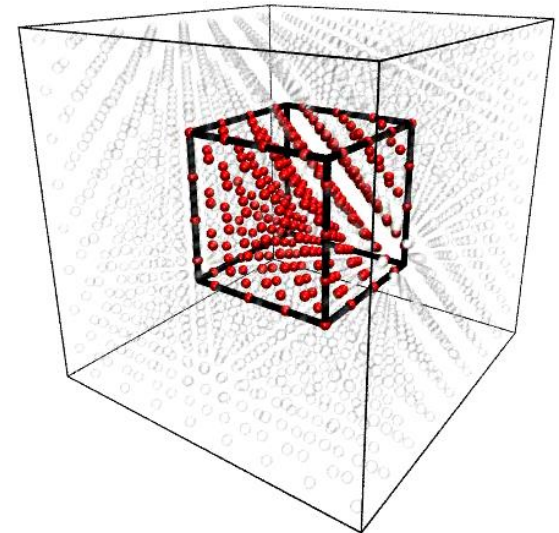
$$= [H(x^+ - x_i) - H(x^- - x_i)]$$

$$\times [H(y^+ - y_i) - H(y^- - y_i)]$$

$$\times [H(z^+ - z_i) - H(z^- - z_i)]$$

- In words

$$\vartheta \equiv \begin{cases} 1 & \text{if molecule is inside volume} \\ 0 & \text{if molecule is outside volume} \end{cases}$$



## Derivative is surface fluxes and stresses

- Taking the Derivative of the CV function

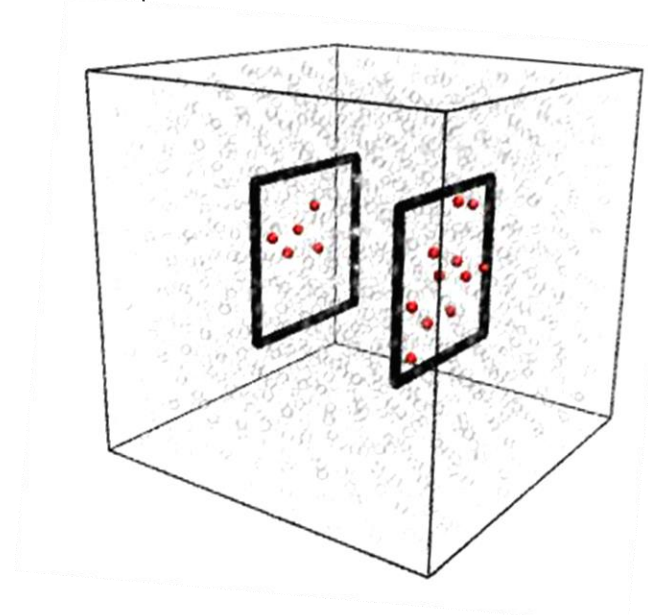
$$dS_{ix} \equiv -\frac{\partial \vartheta_i}{\partial x_i} = [\delta(x^+ - x_i) - \delta(x^- - x_i)] \\ \times [H(y^+ - y_i) - H(y^- - y_i)] \\ \times [H(z^+ - z_i) - H(z^- - z_i)]$$

- Vector form defines six surfaces

$$d\mathbf{S}_i = \mathbf{i}dS_{xi} + \mathbf{j}dS_{yi} + \mathbf{k}dS_{zi}$$

- Or in words

$$d\mathbf{S}_i \equiv \begin{cases} \infty & \text{if molecule on surface} \\ 0 & \text{otherwise} \end{cases}$$



# Pressure (Stress)

- Pressure is the key molecular quantity to couple to larger scales
- Pressure is simply the negative of stress (in fluids we typically have a larger thermal component and subtract fluids flow)

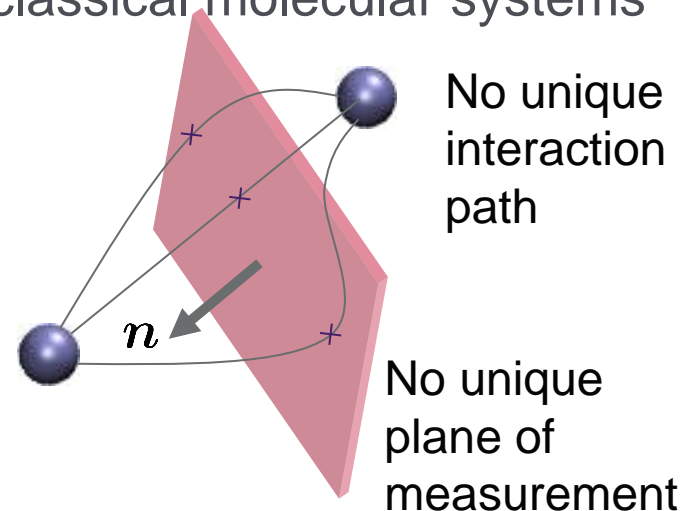
$$P = -\sigma$$

- The stress is known to be non-unique in classical molecular systems

Statistical mechanics of inhomogeneous fluids

BY P. SCHOFIELD† AND J. R. HENDERSON‡

$$\sigma_C^{\alpha\beta}(\mathbf{R}, t) = \sum_i [\nabla_i^\alpha \Phi(\{\mathbf{r}_i\})] \oint_{C_{0i}} d\mathbf{l}^\beta \delta(\mathbf{R} - \mathbf{l}).$$

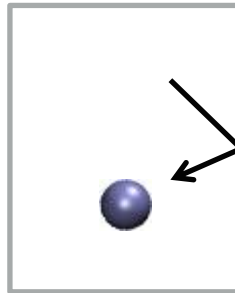


# Pressure (Stress)

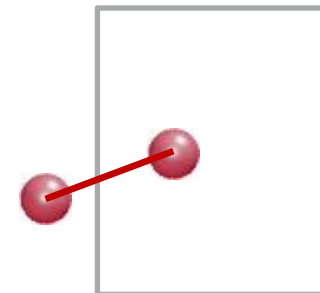
- This integrated volume gives a surface definition of stress
  - Kinetic part due to fluctuations
  - Configurational part due to liquid structure

$$P_{xy} = \underbrace{\sum_{i=1}^N \left\langle m_i \dot{y}_i dS_{ix} \right\rangle}_{\text{Kinetic}} + \underbrace{\frac{1}{2} \sum_{j \neq i}^N \left\langle f_{ijy} dS_{ijx} \right\rangle}_{\text{Configurational}}$$

*Kinetic  
theory part  
Momentum due  
to molecules  
crossing a  
surface  
and returning*



Closed volume – any contour  
must cross a surface



*Configurational  
part  
Inter-molecular  
bonds over the  
surface of the box*

# Coupled Simulation

- Control (Finite) Volume form

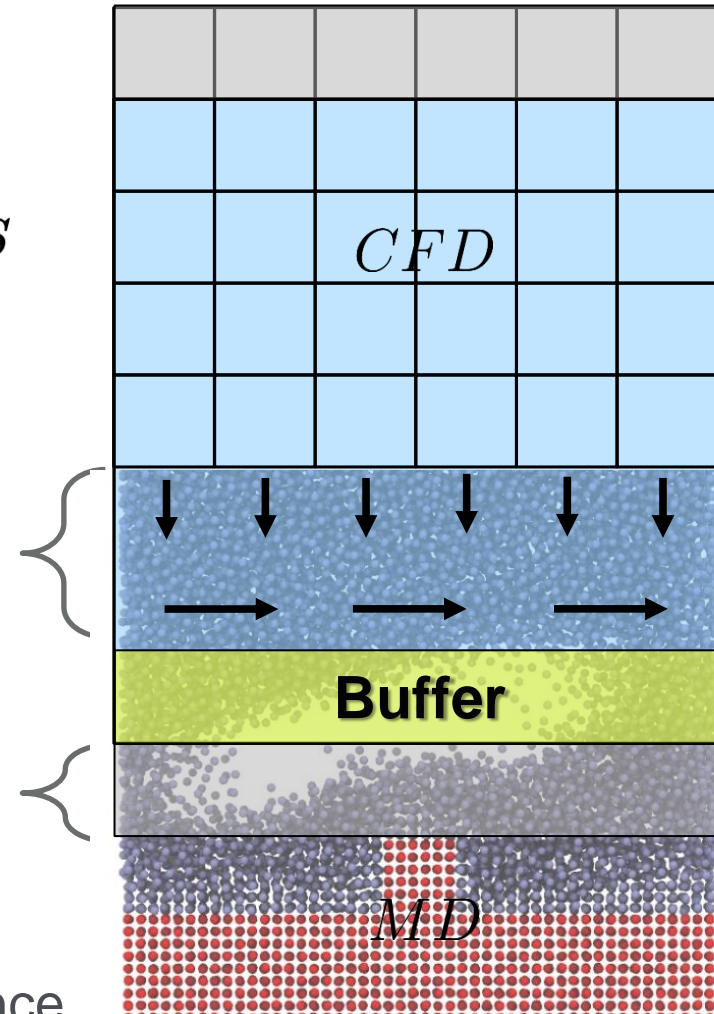
$$\frac{\partial}{\partial t} \int_V \rho u dV = - \oint_S \rho u u \cdot dS - \oint_S \mathbf{P} \cdot dS$$

$$m_i \ddot{\mathbf{r}}_i = \mathbf{F}_i + \mathbf{F}_i^C \vartheta_i$$

**CFD→MD**  
Boundary  
condition

$$\int_V \mathbf{u}^{BC} dV = \sum_{i=1}^N \mathbf{v}_i \vartheta_i$$

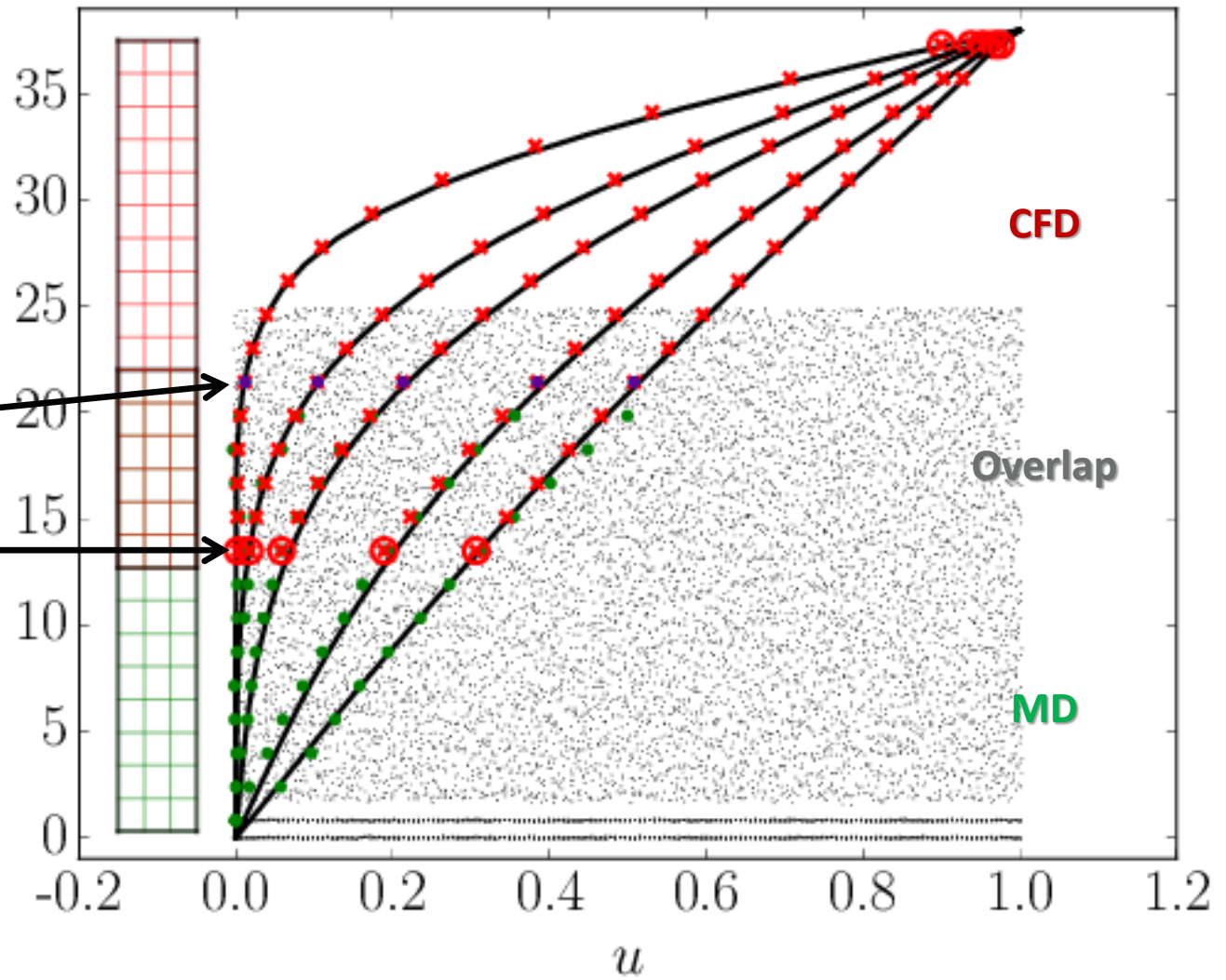
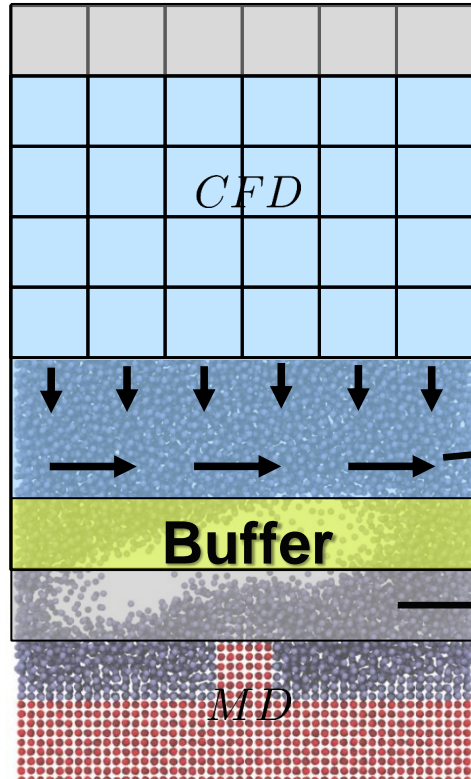
**MD→CFD**  
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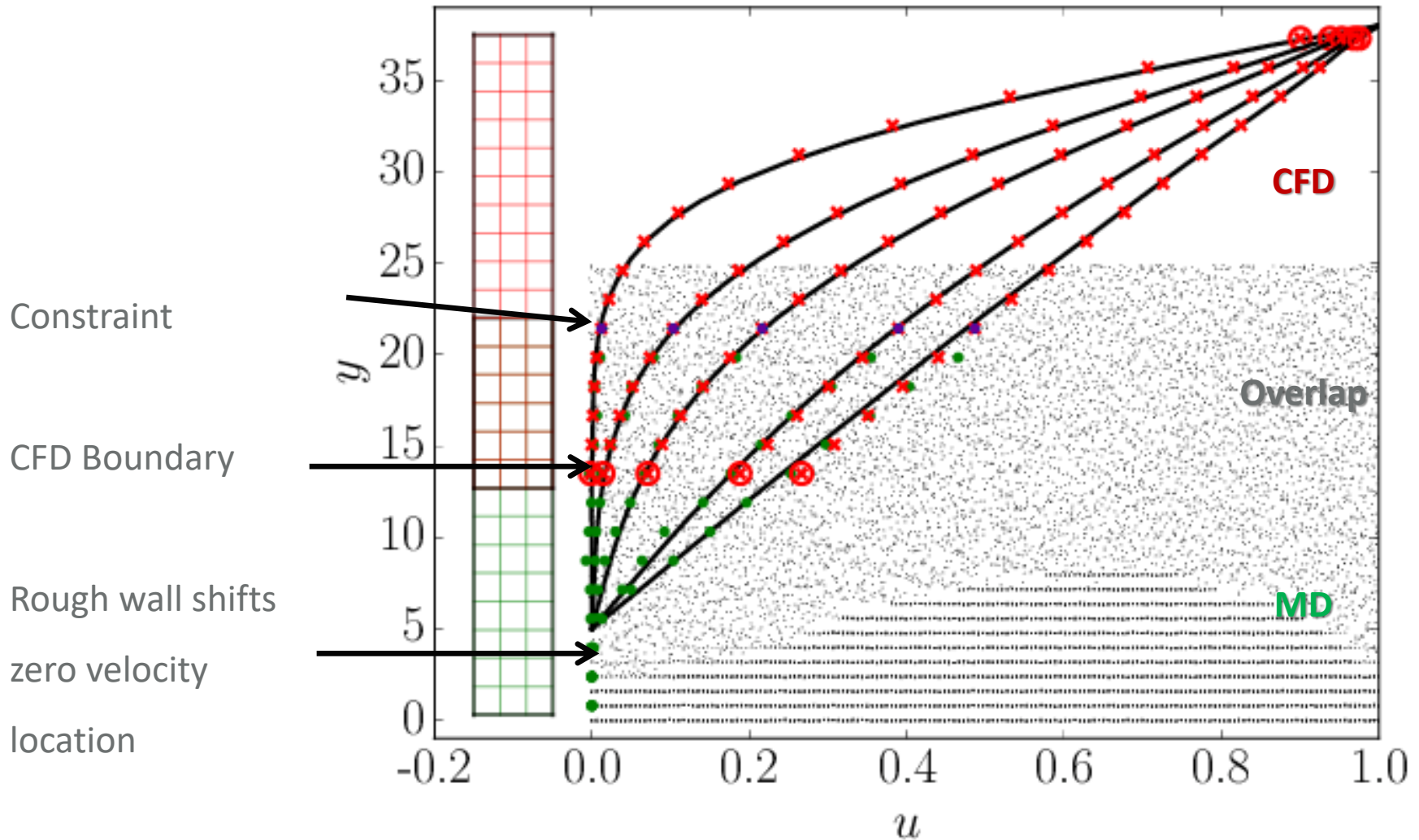
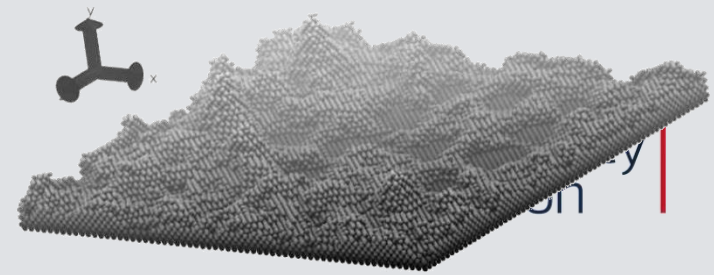
- Both in same Eulerian (fixed) reference



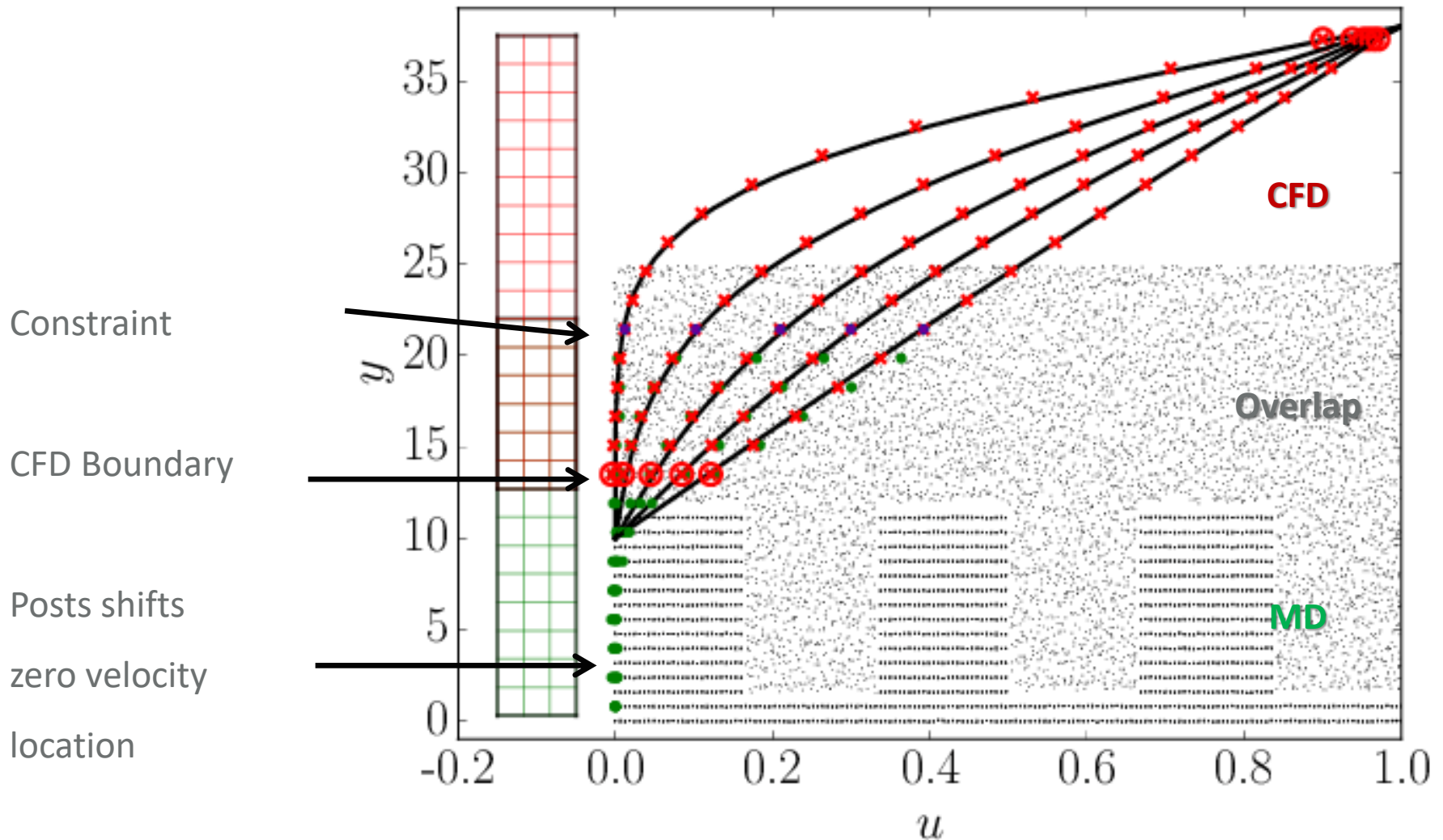
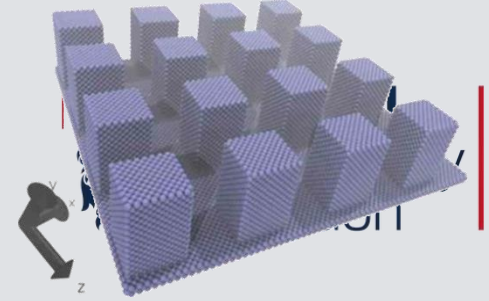
# Coupling Results – Sheared (Couette) Flow



# Coupling Results – Couette Flow



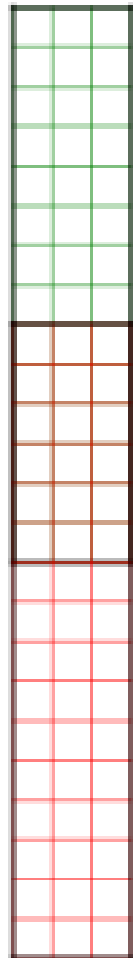
# Coupling Results – Couette Flow







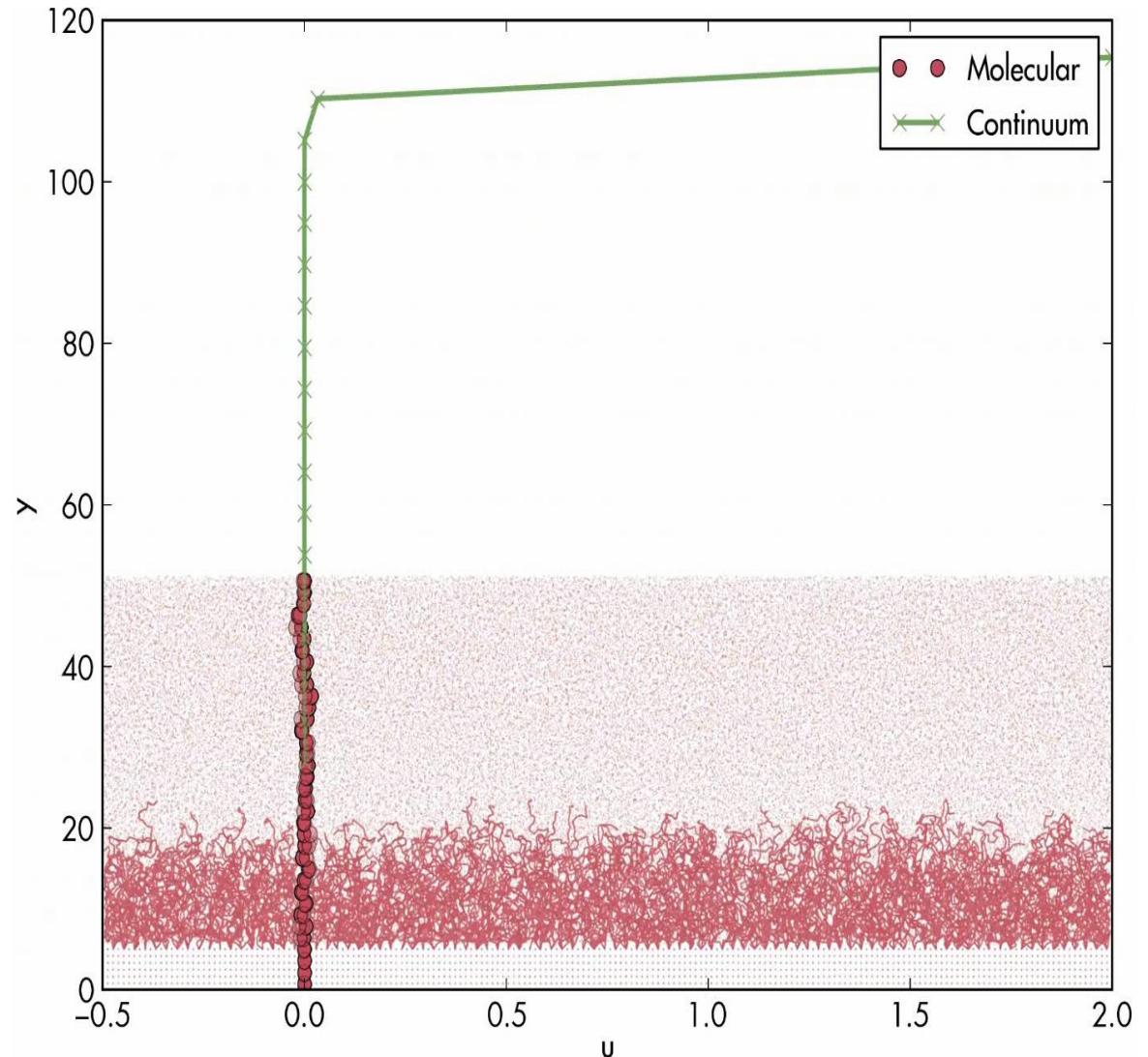
# Coupling Results – Polymer Brushes



CFD  
Region

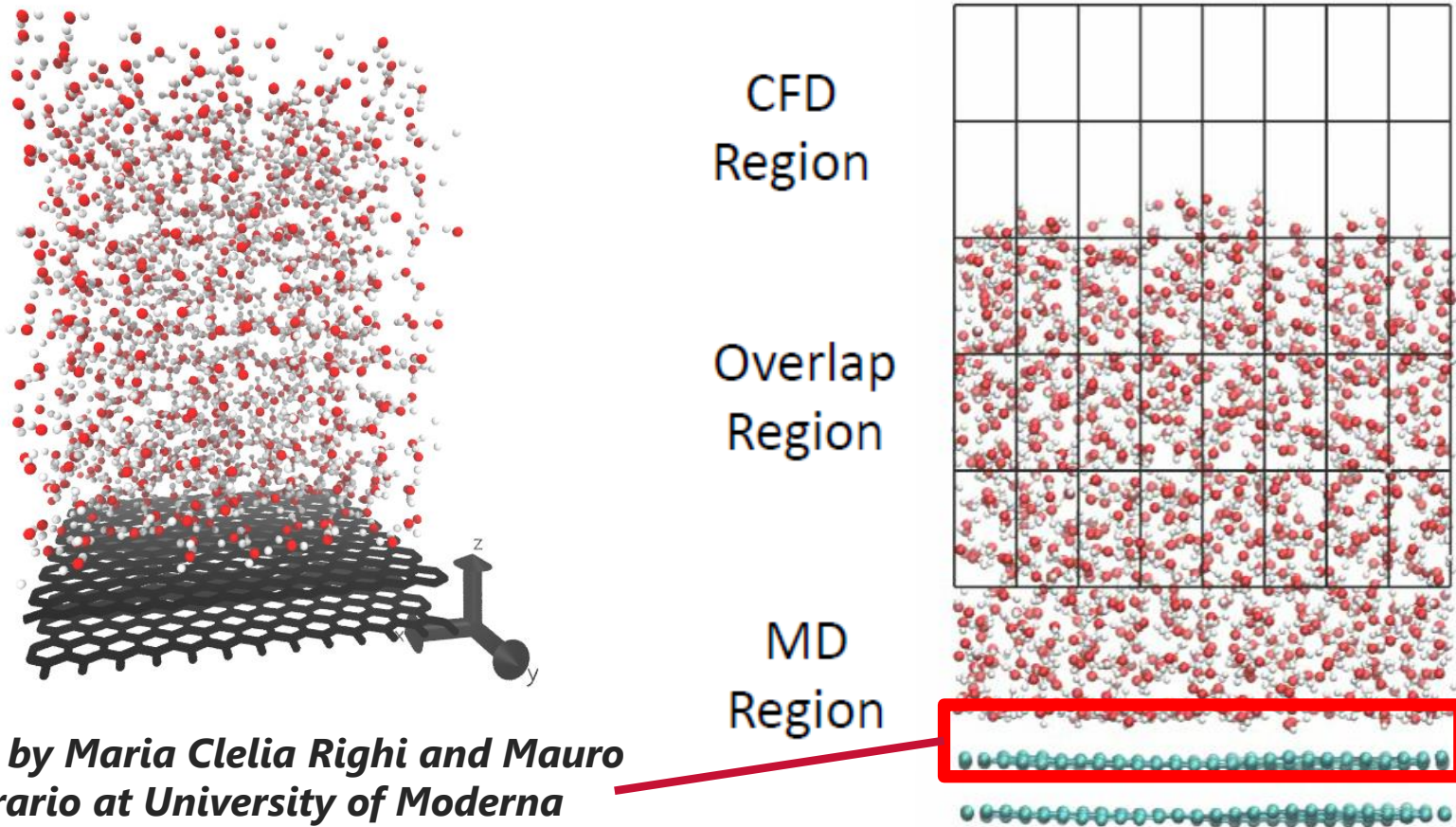
Overlap  
Region

MD  
Region



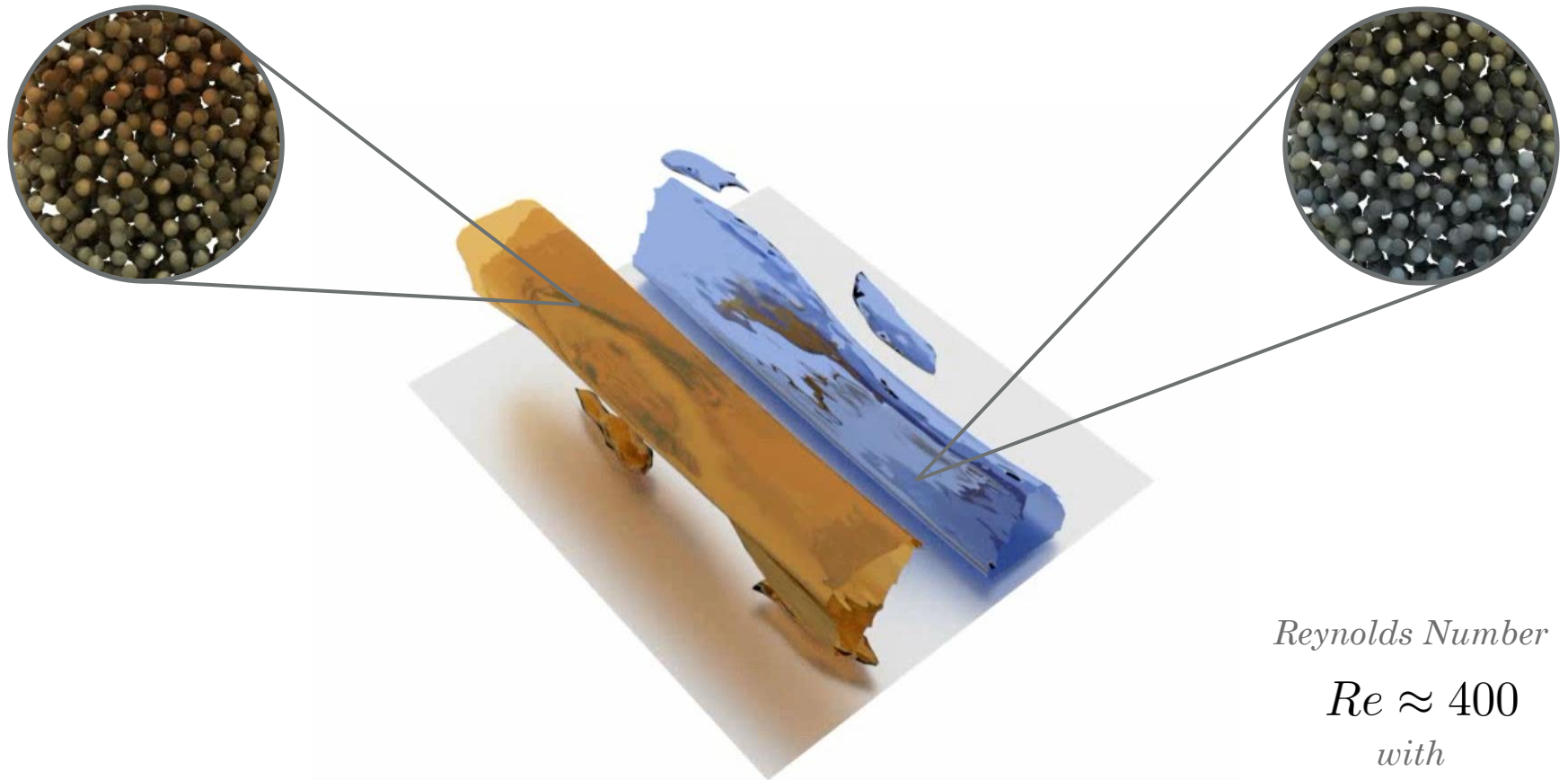


# Coupling Flow Over Graphene



- Classical potentials result in slip-length prediction on graphene which vary by orders of magnitudes

# Molecular Simulation of Turbulence



*Isosurfaces of turbulent kinetic  
energy coloured by velocity*

*Reynolds Number*

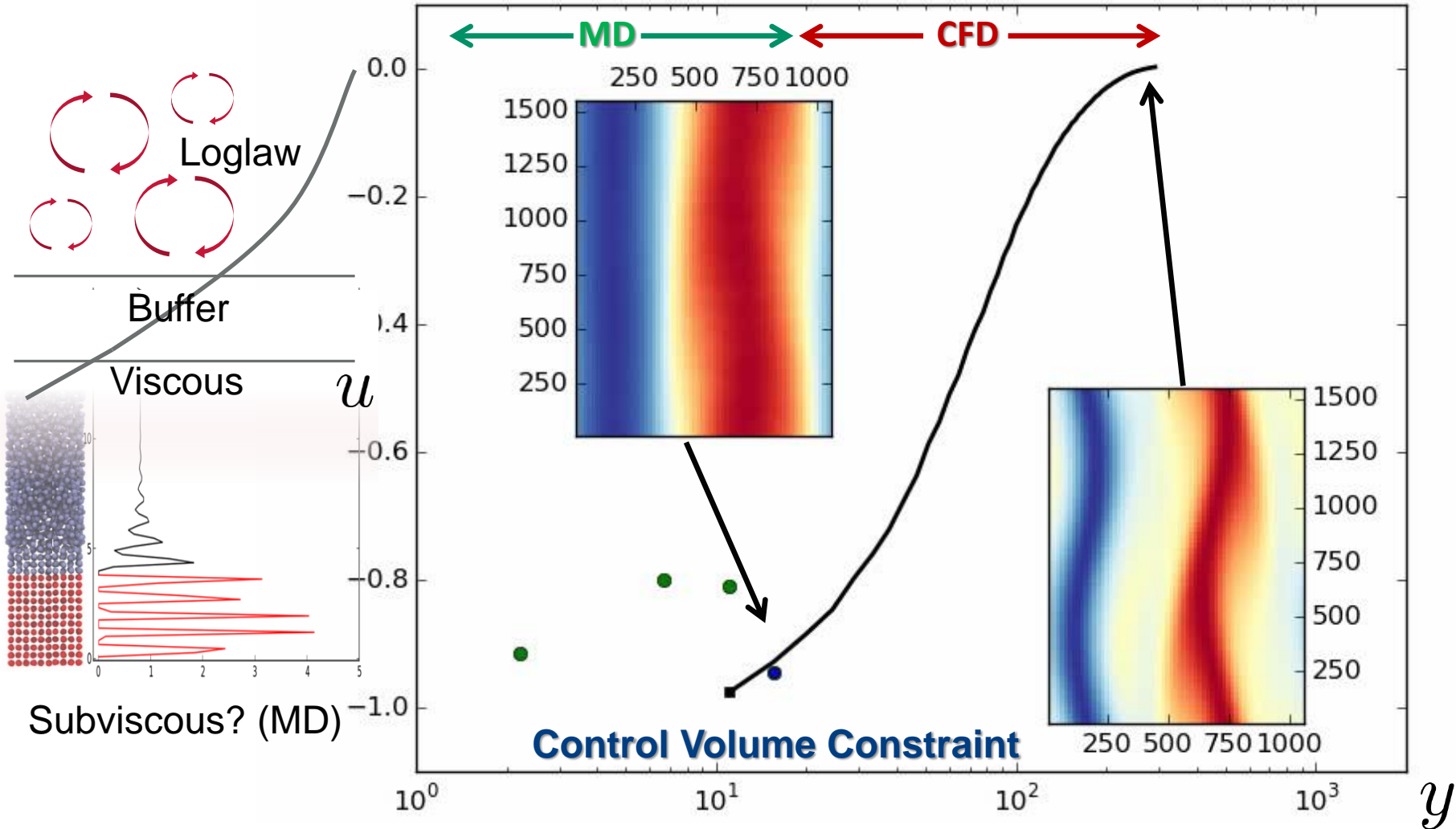
*$Re \approx 400$*

*with  
300 million  
molecules*





# Coupling Results – Turbulent Couette



# Liquid-Vapour Interface

- The Control volume functional is the formal integral of the Dirac delta functional in 3 dimensions (3D top hat or box car function)

$$\vartheta_i \equiv \int_{z^-}^{z^+} \int_{y^-}^{y^+} \int_{x^- + \xi^-(y,z,t)}^{x^+ + \xi^+(y,z,t)} \delta(x - x_i) \delta(y - y_i) \delta(z - z_i) dx dy dz$$

$$= [H(x^+ + \xi^+ - x_i) - H(x^- + \xi^- - x_i)]$$

$$\times [H(y^+ - y_i) - H(y^- - y_i)]$$

$$\times [H(z^+ - z_i) - H(z^- - z_i)]$$

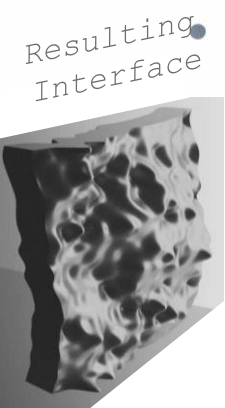
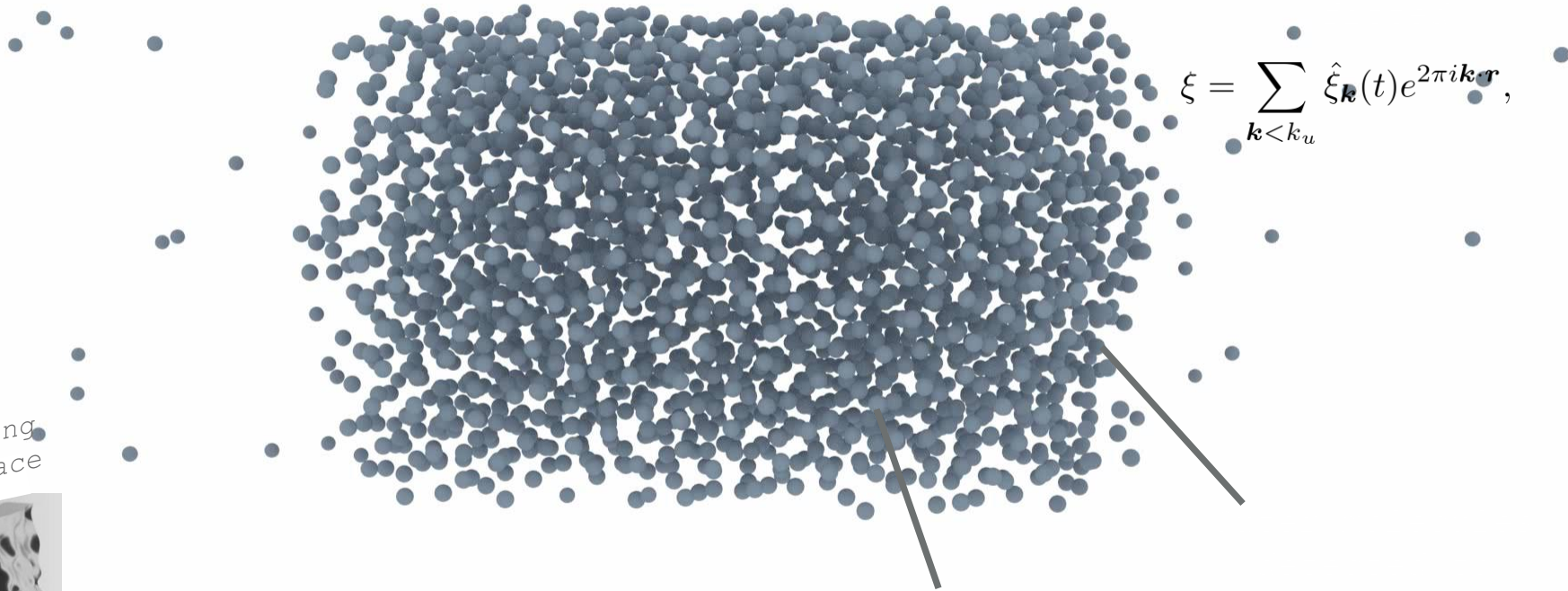


- In words

$$\vartheta \equiv \begin{cases} 1 & \text{if molecule is inside volume} \\ 0 & \text{if molecule is outside volume} \end{cases}$$

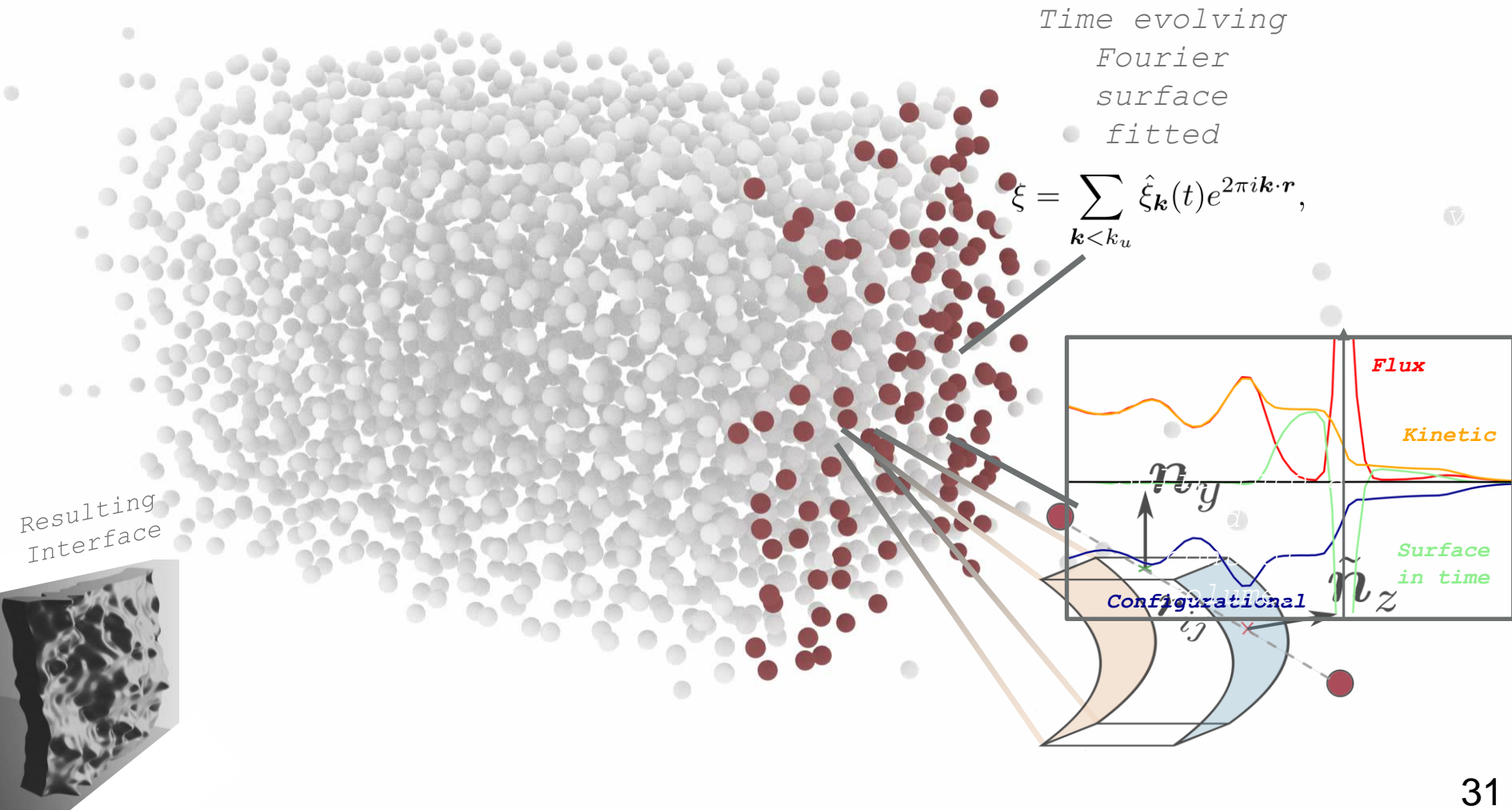


# Liquid-Vapour Interface



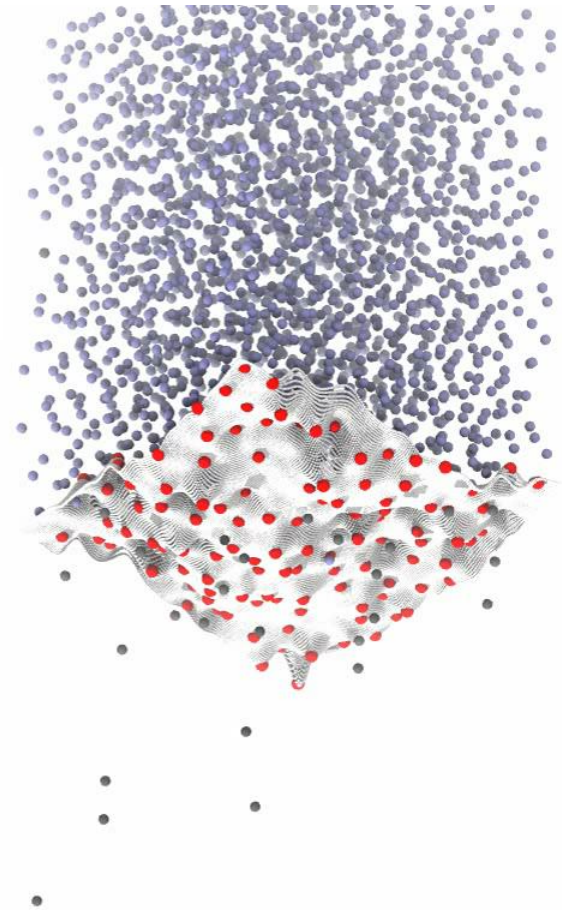
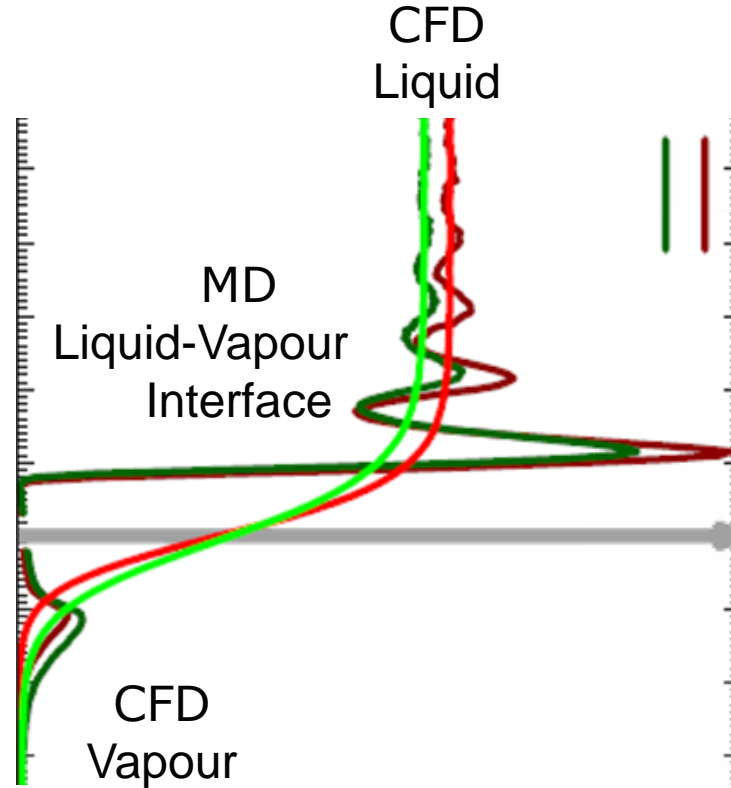
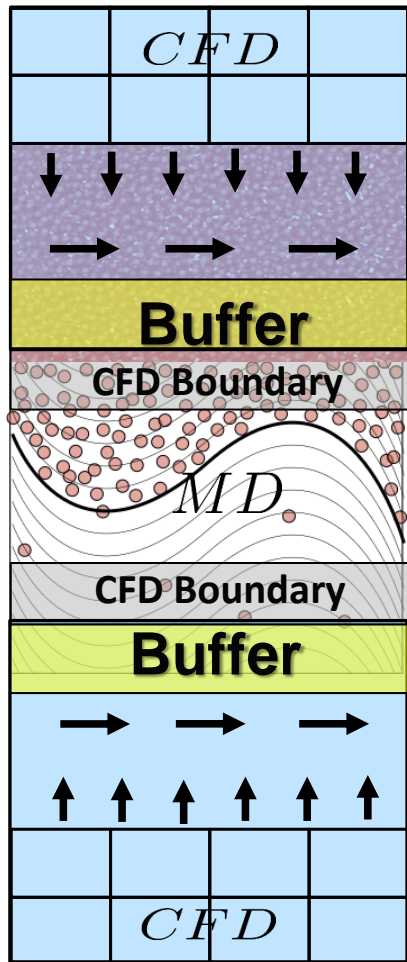


# Liquid-Vapour Interface





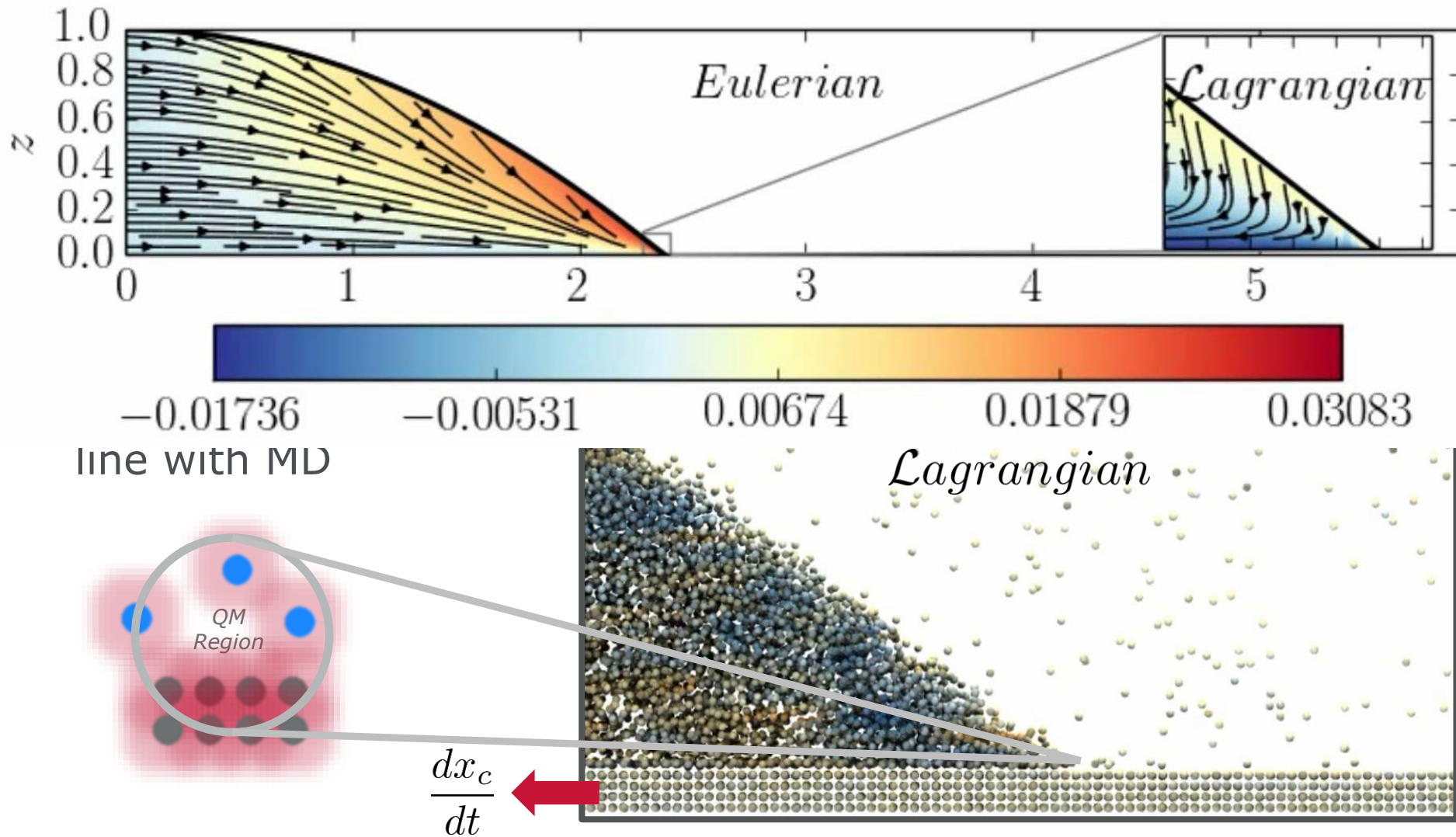
# Coupled Simulation of an Interface





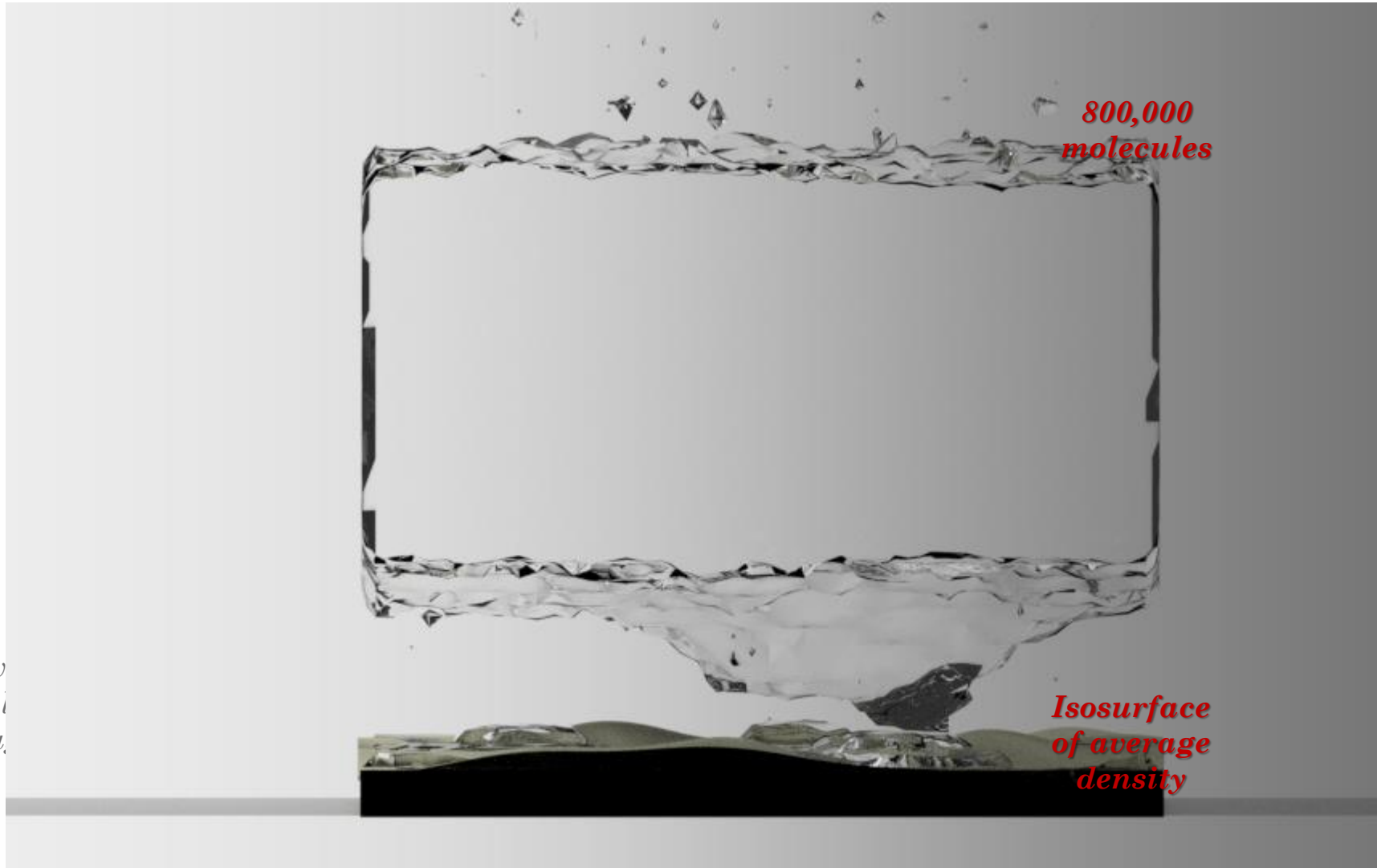


# Moving Contact Line





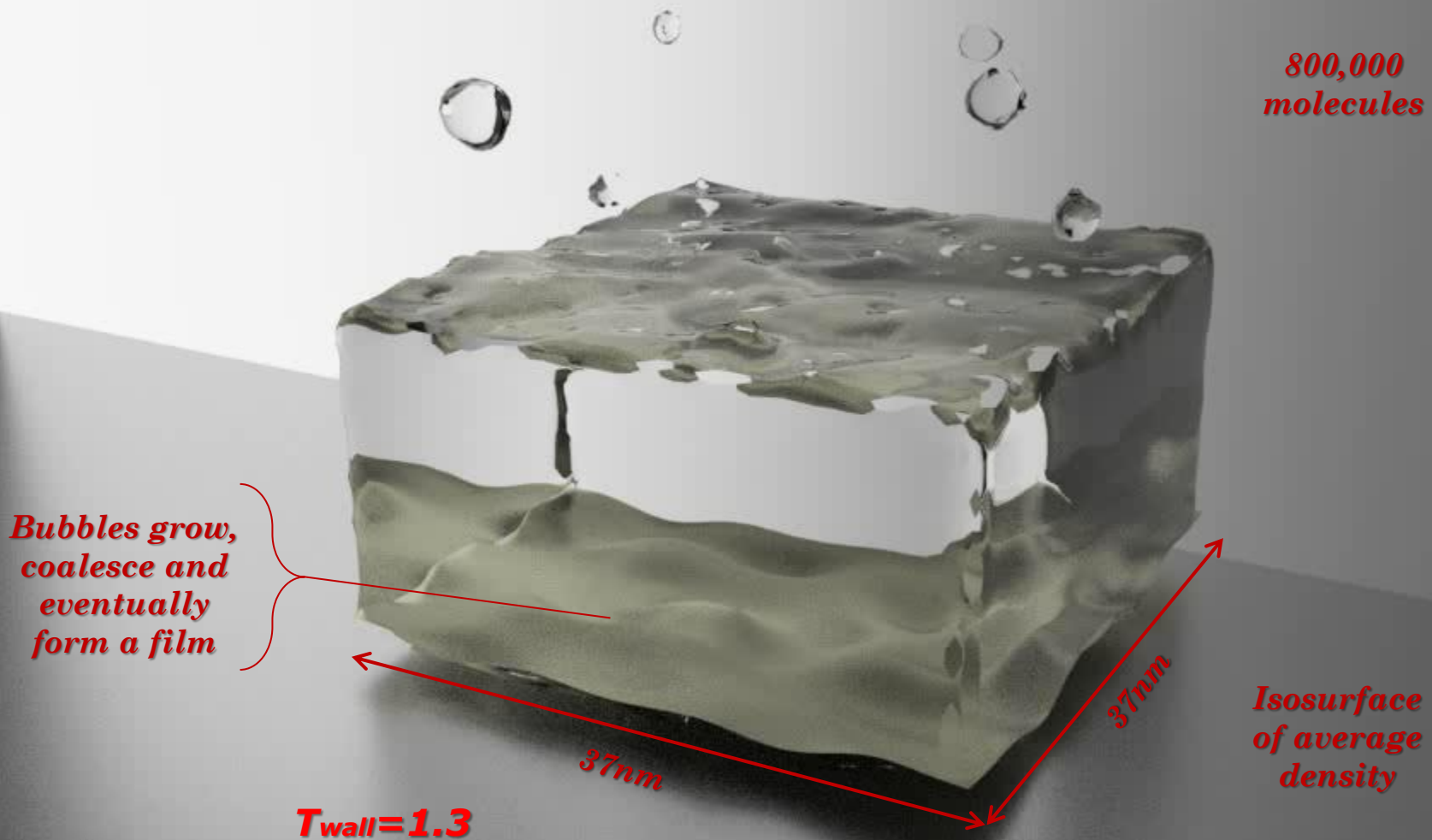
# Molecular simulation of Nucleation



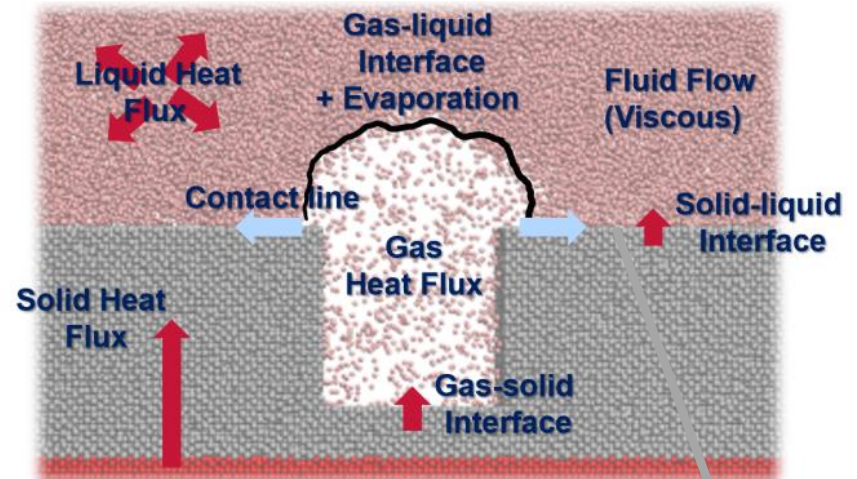
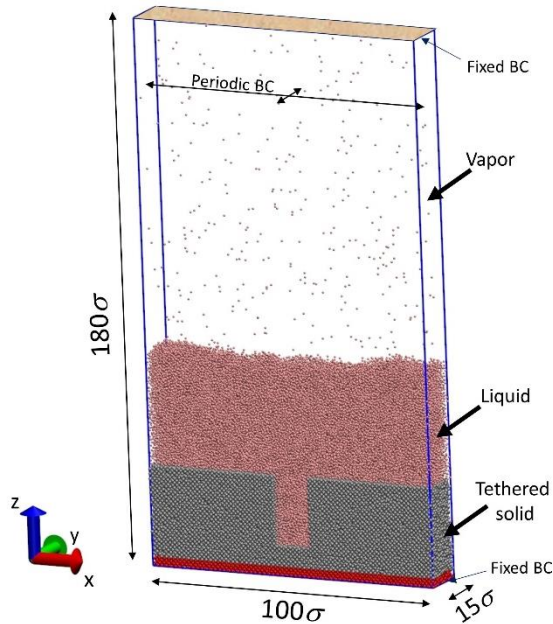
# Molecular simulation of Nucleation



Brunel  
University  
London

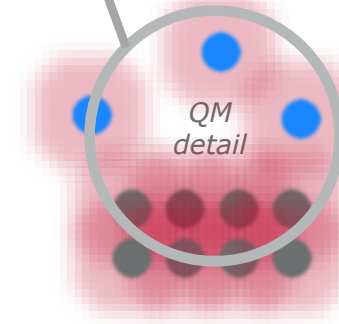


# Molecular simulation of Nucleation



Quantum detail needed for

- Heat transfer in wall material (conductor)
- Interaction of fluid and solid
- Detail of structure if material is connected to a fluid



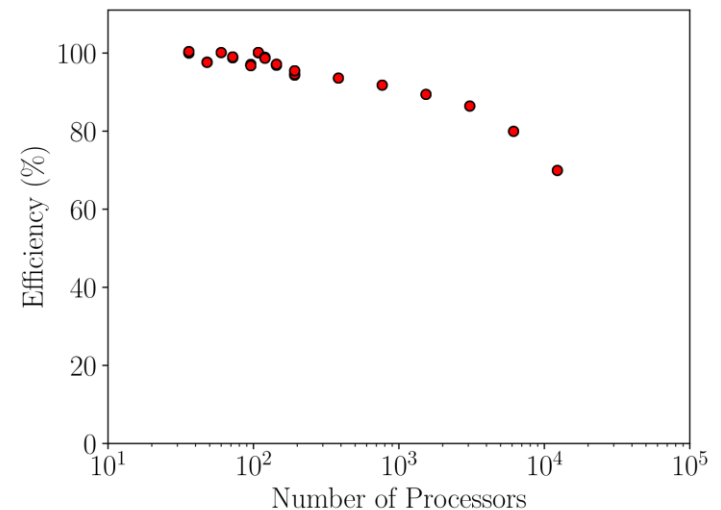
# Software for Coupling

- Open Source ([www.cpl-library.org](http://www.cpl-library.org)) Fortran, C, C++ and Python bindings
- Designed to facilitate the linking of massively parallel codes with minimal impact on performance of each code (based on MPI)
- Shared library with no external dependencies beyond standard packages
- Minimal set of functions and examples with Python and google tests with key functionality (and examples) subject to continuous integration testing
- Aims to allow coupling and topology linking of programs

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	Fluid Dynamics					cpl
					Coupled Simulation	



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**Thank you**

**Any Questions?**

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