



# Multiscale Modeling of Membrane Distillation

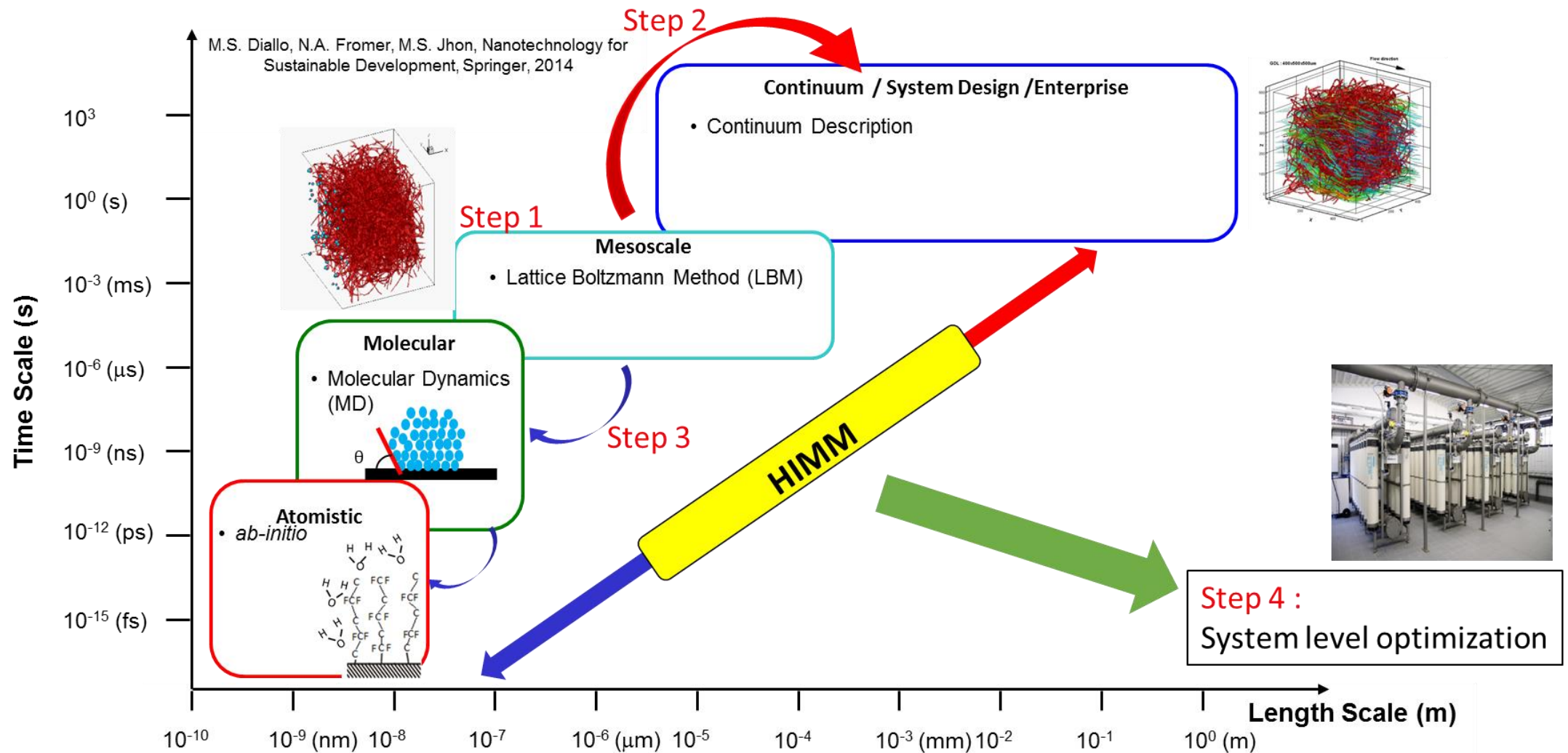
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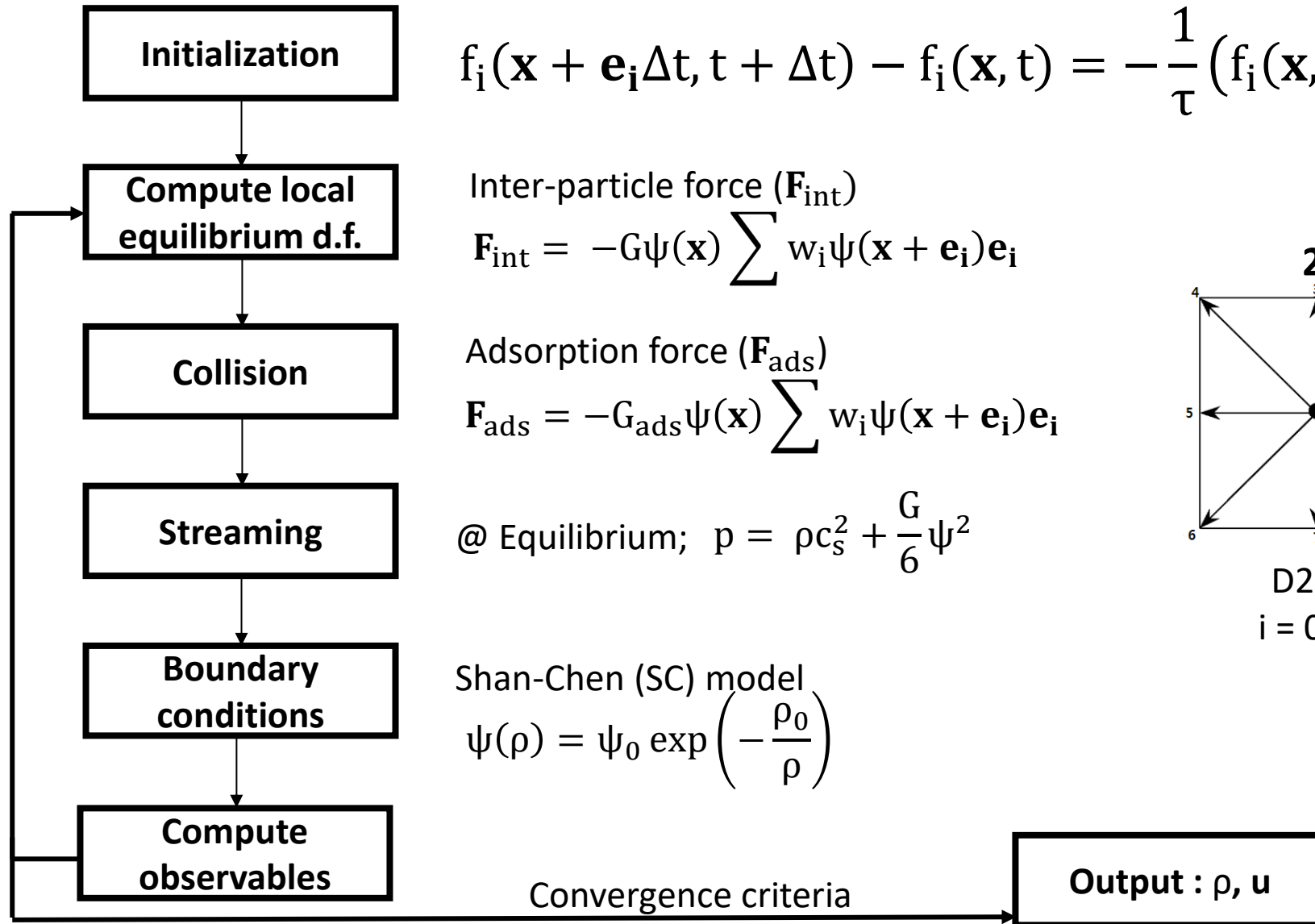
# Essence of Multiscale Modeling

**Goal:** Develop system design criteria via multiscale modeling approach based on Holistic Integrated Multiscale Modeling (HIMM) and optimization (middle-out approach)





# Step 1. Lattice Boltzmann Method (LBM) - Centerpiece



$$f_i(\mathbf{x} + \mathbf{e}_i \Delta t, t + \Delta t) - f_i(\mathbf{x}, t) = -\frac{1}{\tau} (f_i(\mathbf{x}, t) - f_i^{\text{eq}}(\mathbf{x}, t))$$

Inter-particle force ( $\mathbf{F}_{\text{int}}$ )

$$\mathbf{F}_{\text{int}} = -G\psi(\mathbf{x}) \sum w_i \psi(\mathbf{x} + \mathbf{e}_i) \mathbf{e}_i$$

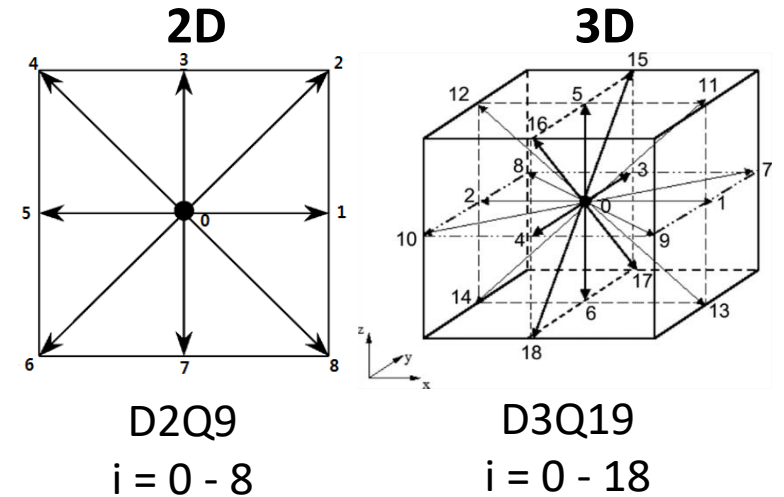
Adsorption force ( $\mathbf{F}_{\text{ads}}$ )

$$\mathbf{F}_{\text{ads}} = -G_{\text{ads}}\psi(\mathbf{x}) \sum w_i \psi(\mathbf{x} + \mathbf{e}_i) \mathbf{e}_i$$

@ Equilibrium;  $p = \rho c_s^2 + \frac{G}{6} \psi^2$

Shan-Chen (SC) model

$$\psi(\rho) = \psi_0 \exp\left(-\frac{\rho_0}{\rho}\right)$$

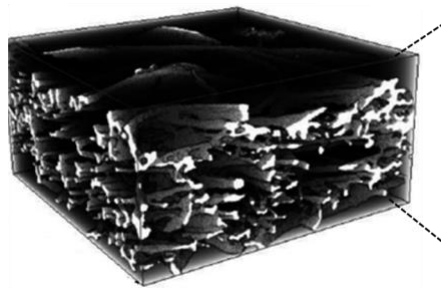


Output :  $\rho, u$

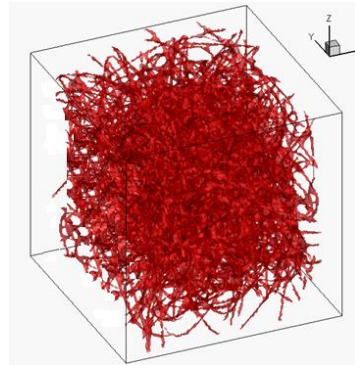


# Step 2. Validation of Our LBM Code

## XCT image to simulation



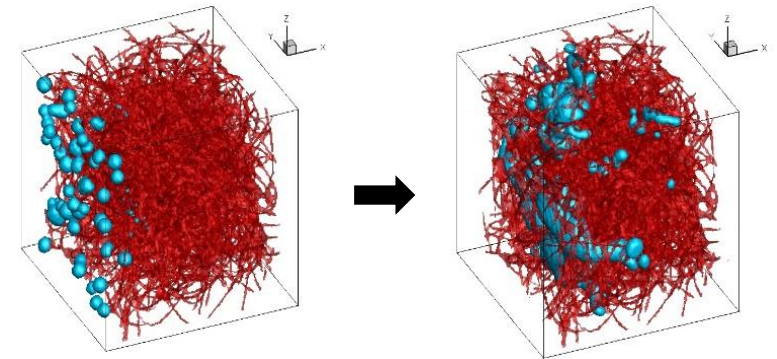
XCT image



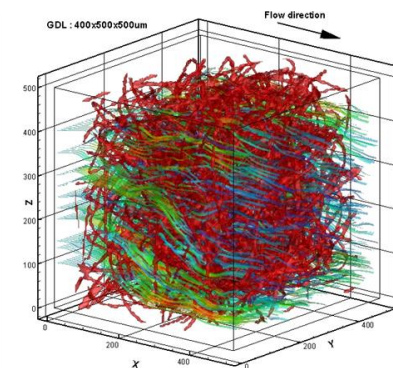
MATLAB generated structure

- By controlling the hydrophobicity, we can calculate contact angles
- Obtain cohesive energy from equation of state
- Obtain adhesive energy from surface-pseudo particle interaction parameter
- Size: 400 X 500 X 500 Lattice units

## Results



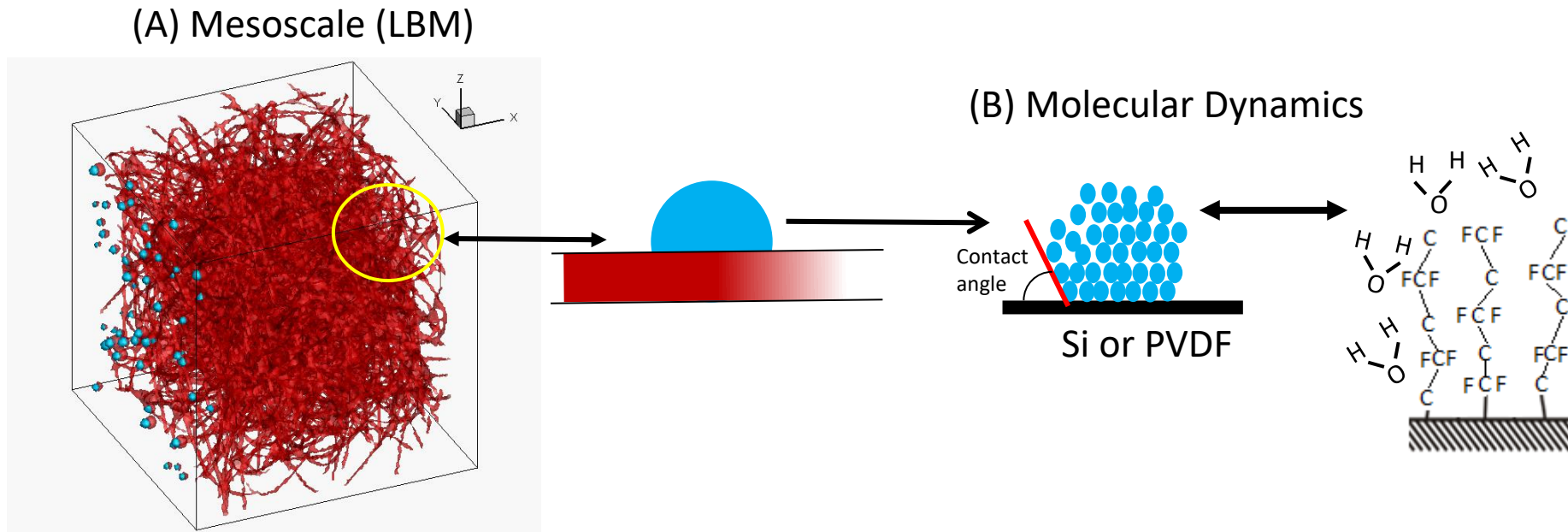
Vapor condenses and flows



Streamline



# Step 3. Linking Mesoscale LBM & Molecular/Atomistic Model



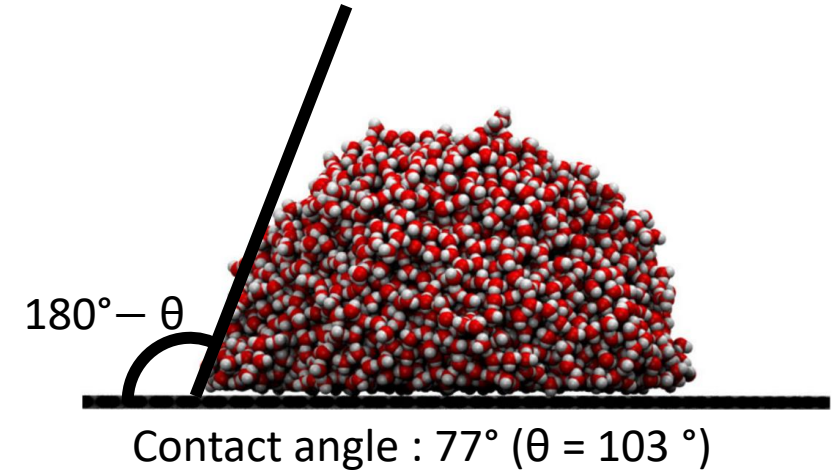
- Need molecular dynamics/Monte Carlo simulation
- Force field analysis based on atomistic scale is required to accurately model potential energy in molecular dynamics
- (A) Mesoscale flow analysis for hydrophobic surface. Water fiber interaction is described by surface-water (pseudo-particle) interaction parameter to analyze contact angle
- (B) Molecular dynamics is performed to calculate contact angle



# Step 3 Case Study - Contact Angle Simulation Using MD

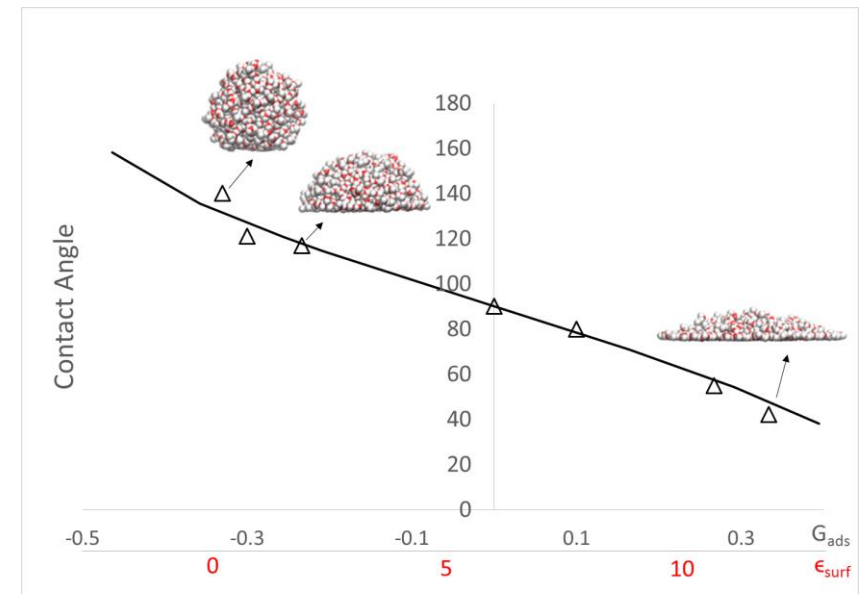
## Simulation details

- 800, 1600, 3200, 6400 molecules
- NVT ensemble (Nose-Hoover thermostat)
- Velocity Verlet algorithm (time interval =  $10^{-15}$  s)
- Typical simulation time per data point : 1 week



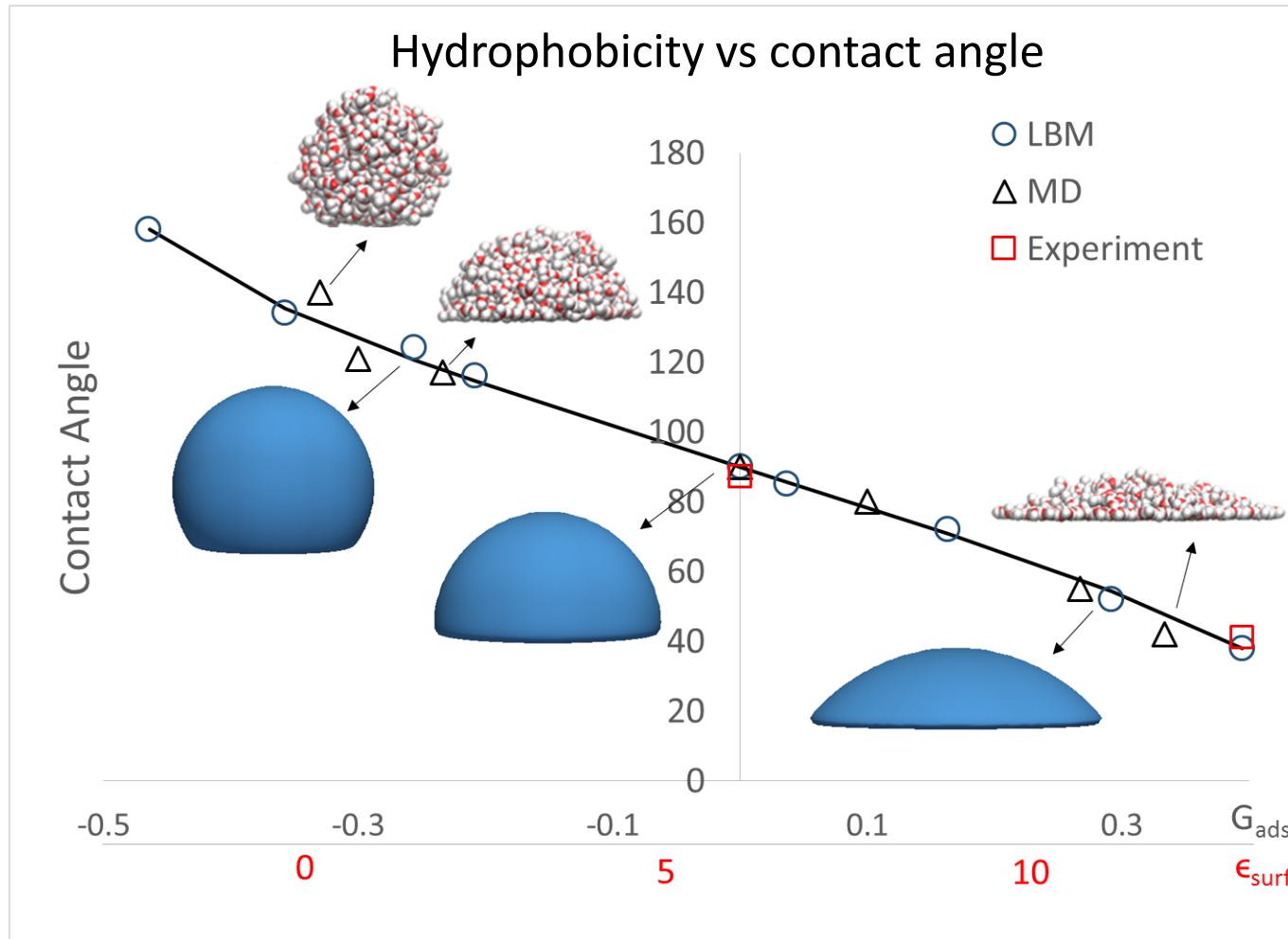
## MD simulation results

Parameters	Values
H-O Bond length	1.0 Å
H-O-H Angle	109.47°
Atomic charge : Hydrogen	+0.4238 e
Atomic charge : Oxygen	- 0.8476 e
O-O L-J distance	3.166 Å
O-O L-J energy	0.155 kcal/mol





# Step 3 Case Study Linking Molecular & Mesoscale Simulation



Both LBM and MD calculations are in excellent agreement upon scaling

Simulation results (LBM & MD) and experimental data are in excellent agreement

For the first time, we obtained relationship between molecular and mesoscale parameters

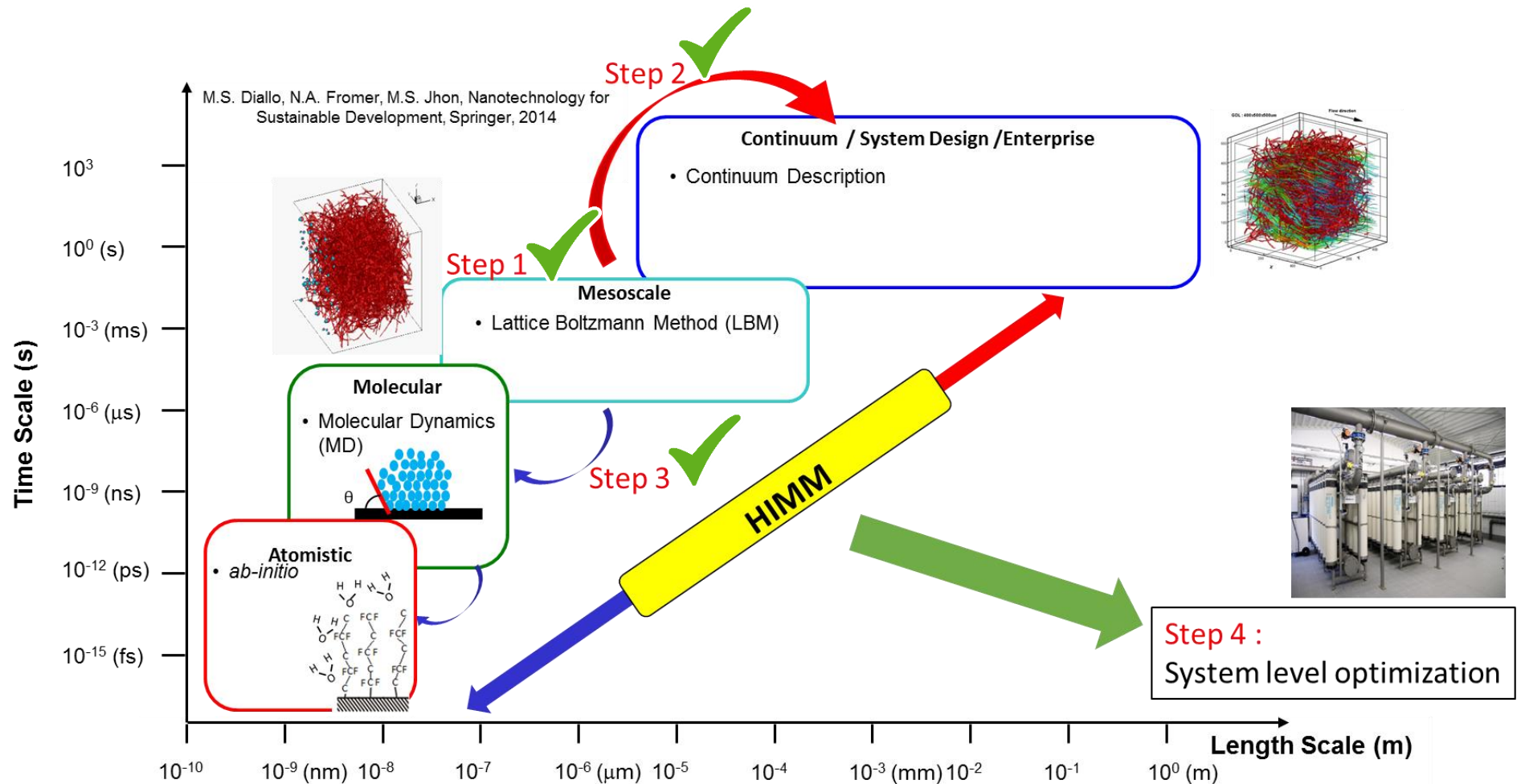
LBM MD

$$19.35G_{ads} = \epsilon_{surf} - 6.56$$



# Step 4 System Level Optimization

Currently, in progress  
Attempts are shown in poster







# Conclusion

- We have developed a novel multiscale model, called HIMM, to provide design criteria using molecular/atomistic input using coarse-grained model and reduced order parameters.
- Fuel cell & membrane distillations were chosen as the benchmark examples for HIMM,
- We developed multiphysics LBM code to calculate vapor flux with hydrophobicity as an input. (Step 1&2)
- For the first time, we calculated contact angle using molecular dynamics & LBM (mesoscale analysis) and linked parameters in the both models. (Step 3)
- We are capable of simulating/controlling the vapor flux for molecularly complex surfaces.
- Once multiscale algorithm is fully established, we may be able to provide molecular design criteria for membrane systems. (Step 4)