

# **Application of Coarse-grained Methods to Nano-colloid Rheology**

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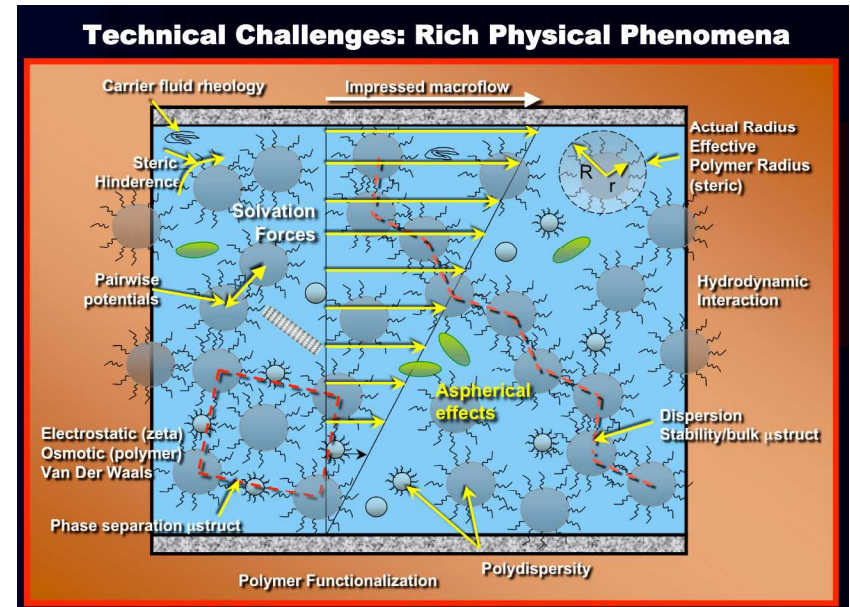
# Motivation

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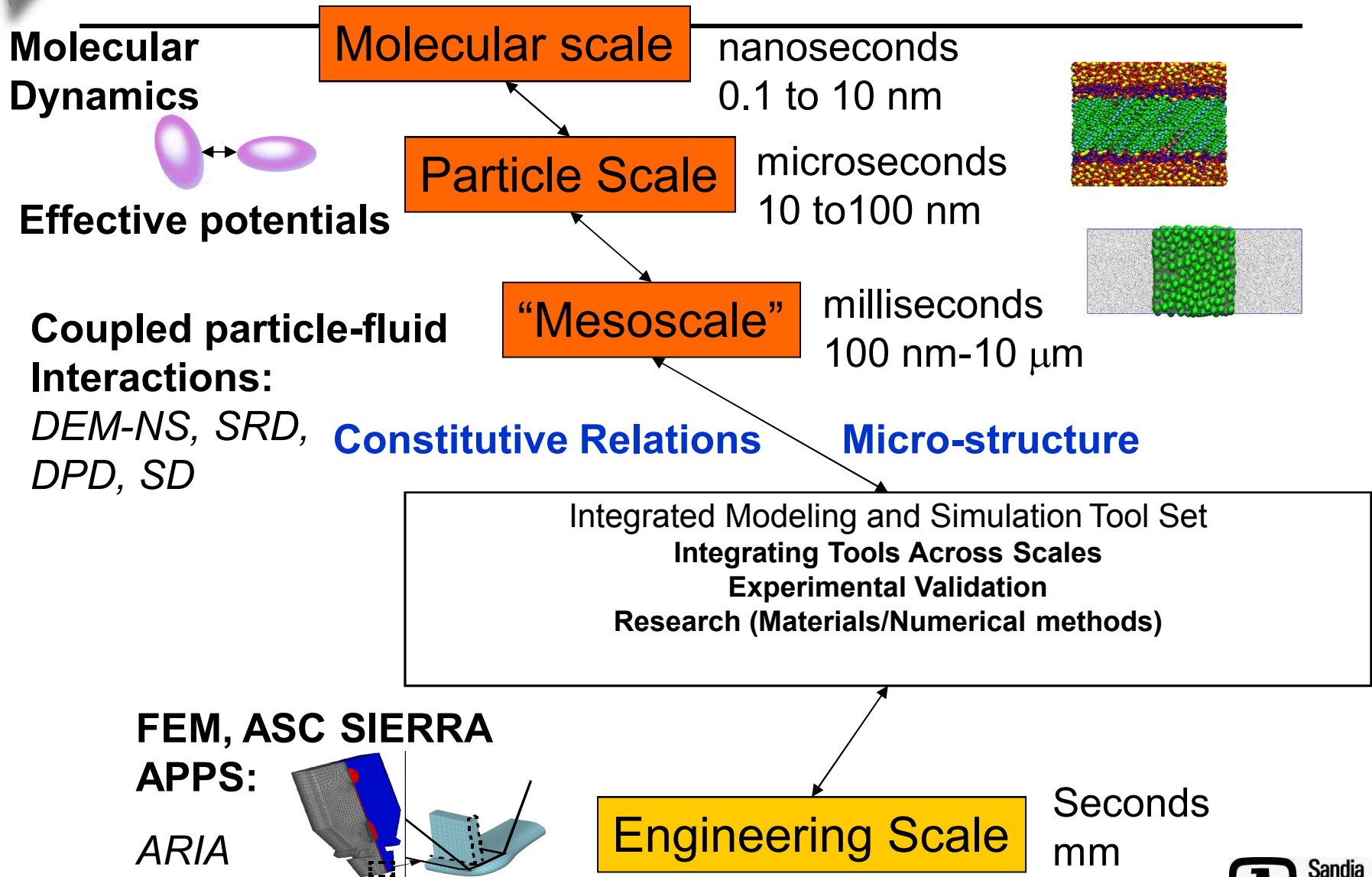
- Nanoparticles of various sizes, shapes, and materials provide new opportunities to manufacture functionally tailored materials and devices
- Efficient processing requires understanding the rheological properties of the suspensions
- **Goals:**
  - Develop computational tools to analyze nano and colloidal suspension flows
    - Must be general, robust, accurate, and efficient
      - coarse-grained solvents
      - complex colloid interactions
      - aspherical colloids

# Physical System: Total Size and Time

- Low Pe
  - Dispersion stability
  - Mild rheology
- High Pe: Rheology of dense, aspherical nanoparticle suspensions
  - Length and time scales
    - Some rules of thumb
      - $O(10^4)$  particles
      - Strain  $O(10)$  box units
      - $\dot{\gamma} \sim 100 \text{ s}^{-1}$
      - $2a_{\text{eff}} \sim 10 - 1000 \text{ nm}$
      - $\Phi_{\text{sc}} \sim 0.5$
    - $L \sim O(0.1 - 10 \text{ } \mu\text{m})$
    - $v_s \sim O(10 - 1000 \text{ } \mu\text{m/s})$
    - $T \sim O(0.1 - 1 \text{ s})$

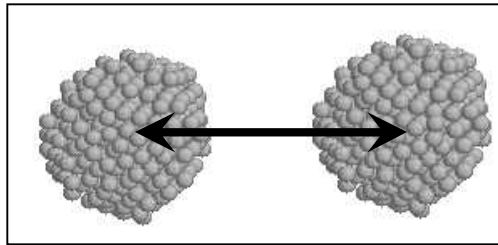


# Technical Approach: Integrated, Hierarchical Capability

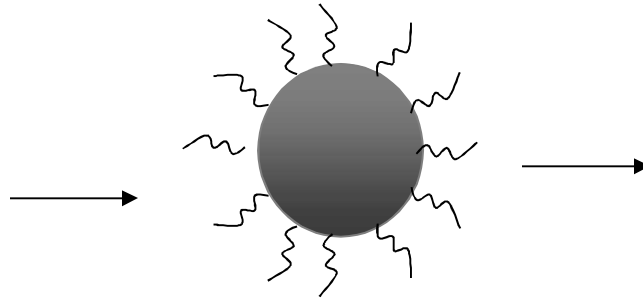


# What is needed? - Coarse Graining

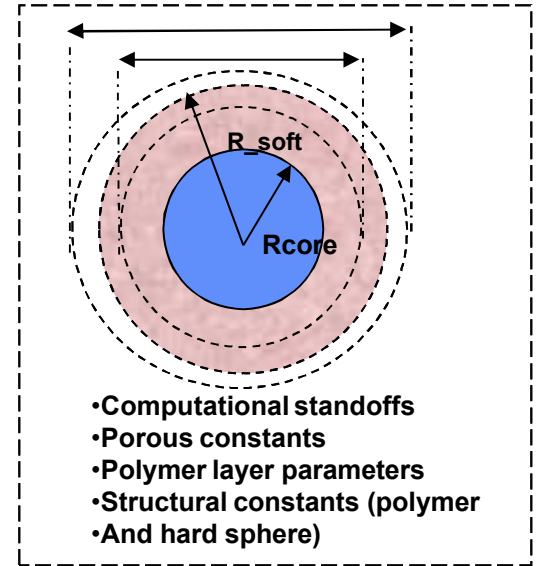
## Particle



Integration to Hamaker's Equation and equivalent

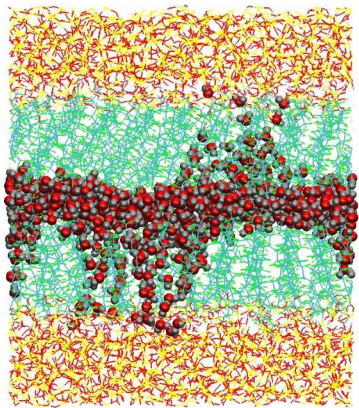


Osmotic and steric/structural representation



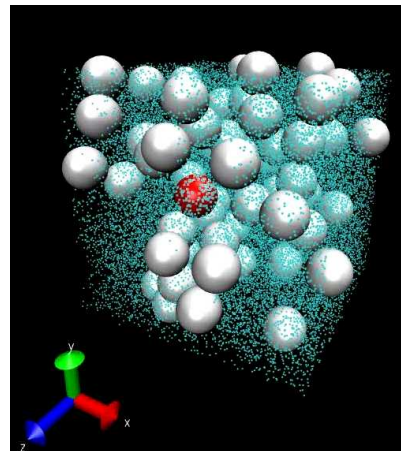
## Solvent

Molecular Dynamics

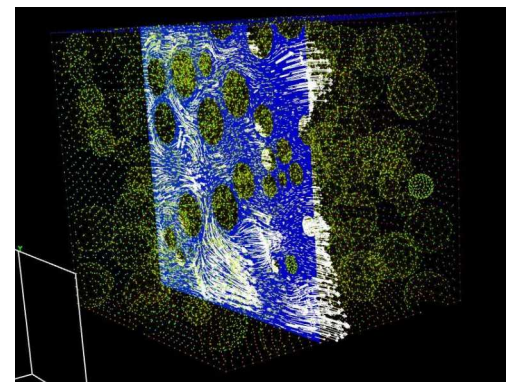


Grest et al.

Blobs->SRD/DPD: dual particle approach



Continuum: FEM, SD



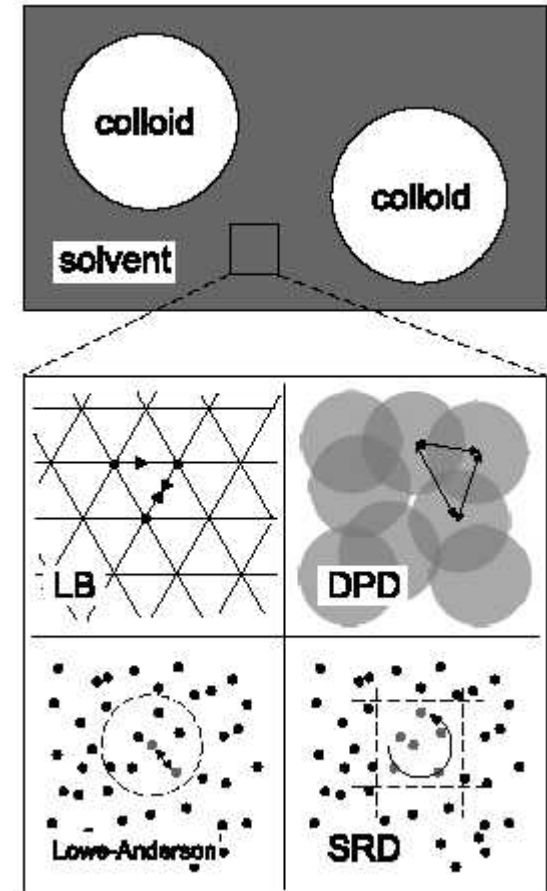
# Solvent Methods

- **Multiple methods to treat hydrodynamics**

- Particle-based (“explicit”) treatment of solvent
  - Atomistic solvent (e.g. LJ solvent)
  - “Approximate” coarse-grained solvent
    - DPD solvent
    - SRD solvent treated as ideal fluid particles with a mass
- Continuum approaches
  - BD – Stokes drag, Oseen tensor, FLD, etc.
  - SD/BEM
  - Solve continuum Navier-Stokes equations numerically

- **Computational cost**

- MD requires the calculation of all solvent-solvent interactions which are typically *many* orders of magnitude larger in number than the solute particles
- SRD computational cost scales as  $N$





# Governing Equations

- Langevin Equation

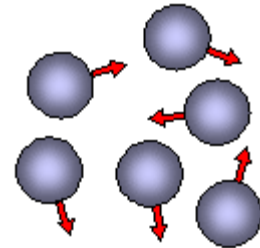
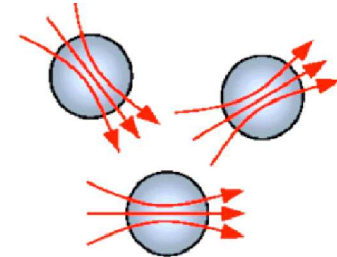
$$m \frac{dU}{dt} = F^H + F^B + F^P$$

- Hydrodynamic Force

$$F^H = -R U$$

- Brownian Force

$$\begin{aligned} \langle F^B \rangle &= 0 \\ \langle F^B F^B \rangle &= 2kTR/\Delta t \end{aligned}$$



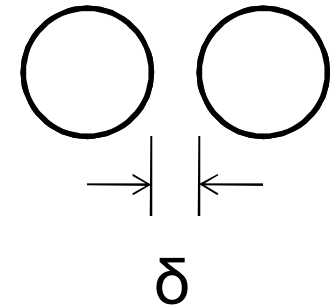
# Hydrodynamic Interaction

- PME Stokesian Dynamics  $O(N \log N)$

$$R = (I - \mathcal{R})^{-1} R_{1B} + R_{lub}$$

- Fast Lubrication Dynamics  $O(N)$

$$R = R_0 + R_\delta$$



**Isotropic Constant**

Tuned to Match

Average Mobility

**Asymptotic lubrication Interaction only**

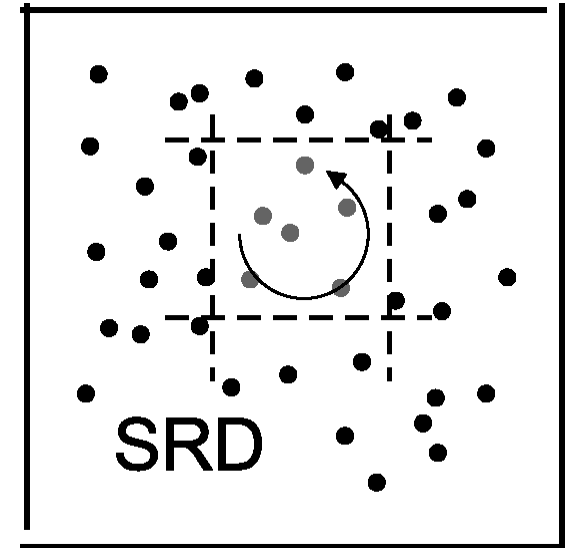
$\delta$  FLD  $\sim 1/\delta$

$\delta$ -log $\delta$  FLD  $\sim 1/\delta + \ln(1/\delta)$



# Stochastic Rotation Dynamics (SRD)

- Simulation domain divided up into cubic cells of side  $a$ 
  - On average,  $M$  SRD particles with mass  $m_f$  are placed in each cell of volume  $\Delta x^3$
- Two simulations steps
  - Particle streaming
    - particles move according to Forward Euler  $\mathbf{v}_i \tau$
  - Velocity update (coarse-grained collision)
    - Apply rotation about randomly chosen axis to fluctuating part of the velocity



$$\mathbf{v}_i(t + \tau) = \mathbf{u}(\xi_i(t + \tau)) + \omega(\xi_i(t + \tau))(\mathbf{v}_i(t) - \mathbf{u}(\xi_i(t + \tau)))$$

- Can also have  $U(r_{coll} - r_{SRD})$

$$m_f \frac{d\mathbf{v}_i}{dt} = \mathbf{f}_i$$

$$\frac{d\mathbf{r}_i}{dt} = \mathbf{v}_i$$

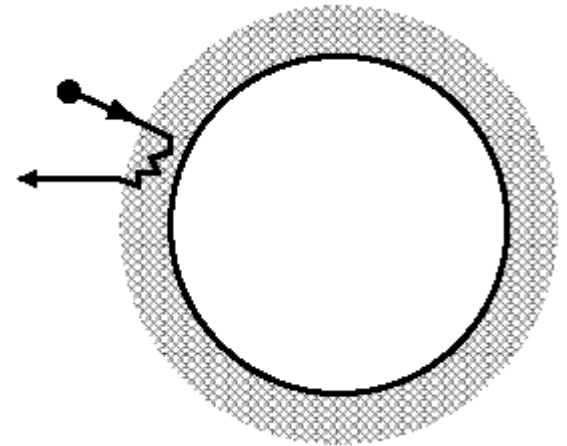
# Coupling to Colloids

- To avoid finite size effects  $a < R_c/2$
- Srd particles collide with colloids
  - Solvent coarse-grained so assume no-slip via stochastic rule
    - SRD particle receives a new random velocity magnitude

$$P(v_n) \propto v_n \exp(-\beta v_n^2)$$

$$P(v_t) \propto \exp(-\beta v_t^2)$$

- Difference in new and old velocity is momentum transferred to colloid
- Can have generalized slip conditions or pair-interaction,  
 $U(r_{coll}-r_{SRD})$



# Selecting Parameters for LJ System

- Dynamics of interest

$$D_{coll} = \frac{1}{6\pi R_{coll}} \left( \frac{k_B T}{\rho_f v_f} \right), \quad v_r = v_{bulk} / v_f$$

$$Pe = \frac{\tau_D}{t_s} = \frac{4R_{coll}^2 / D_{coll}}{2R_{coll} / u_s} = 12\pi u_s R_{coll}^2 \left( \frac{\rho_f v_f}{k_B T} \right)$$

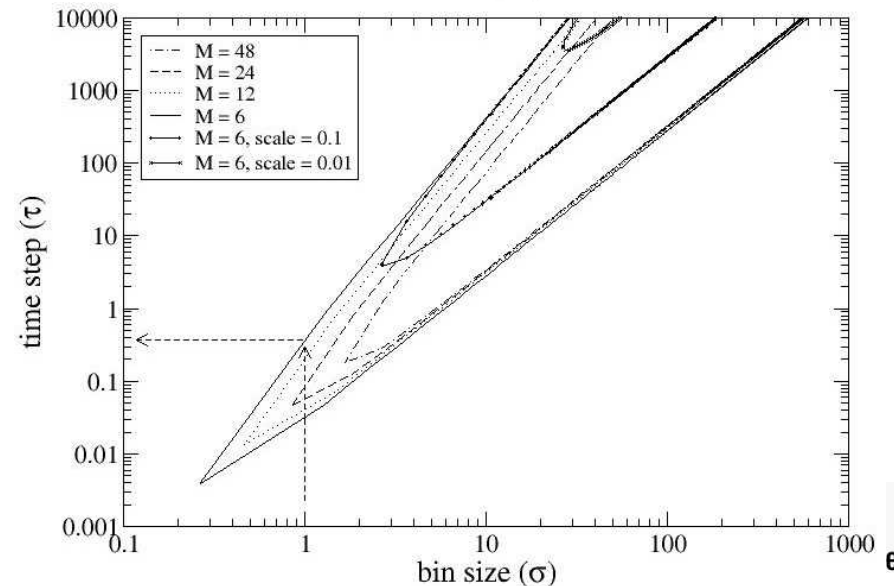
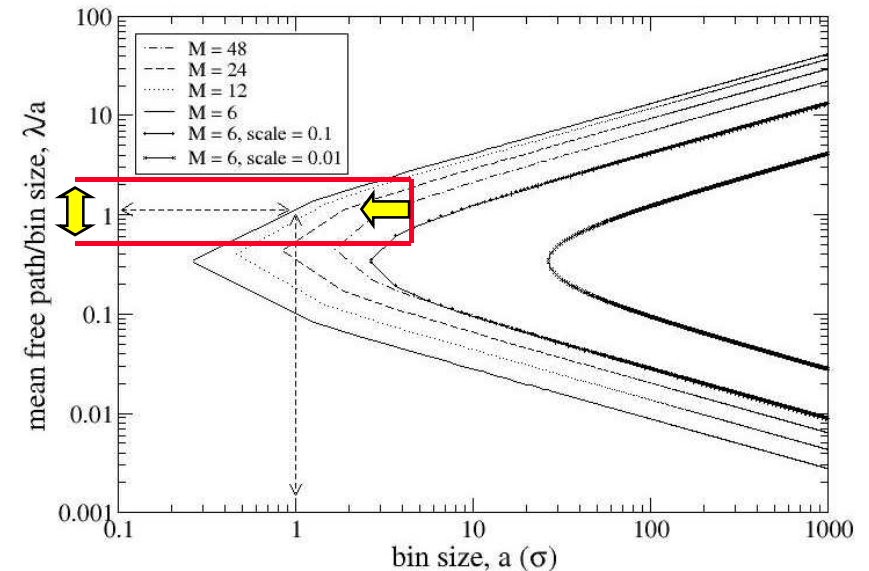
- Physical parameters:  $\rho_f, v_f, kT, P, R_{coll}$

- Computational parameters

$$v_f = \frac{\Delta x^2}{18\Delta t} \left( 1 - \frac{1 - e^{-M}}{M} \right) + \frac{k_B T \Delta t}{4\rho_f \Delta x^3} \frac{M(M+2)}{M-1}$$

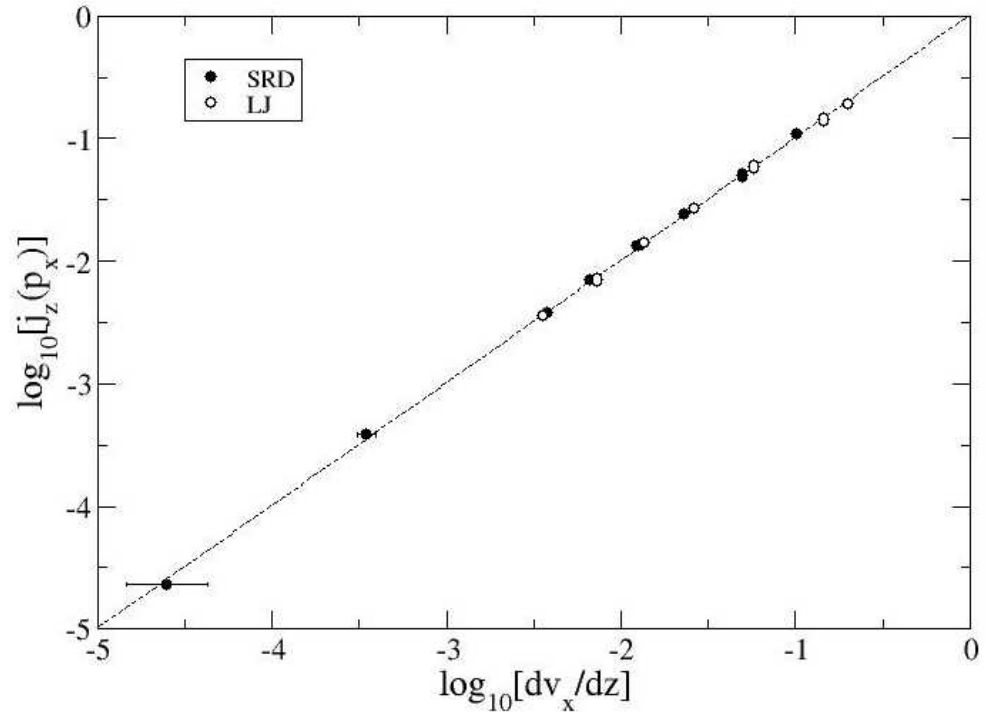
$$\lambda = \Delta t \sqrt{\frac{M k_B T}{\rho_f \Delta x^3}}, \quad \lambda > 0.5\Delta x, \quad \lambda \ll R_{coll}$$

$$\rho_f = \frac{M m_f}{\Delta x^3}, \quad \frac{P}{k_B T} = \frac{M}{\Delta x^3}, \quad \Delta x < R_{coll} / 2$$



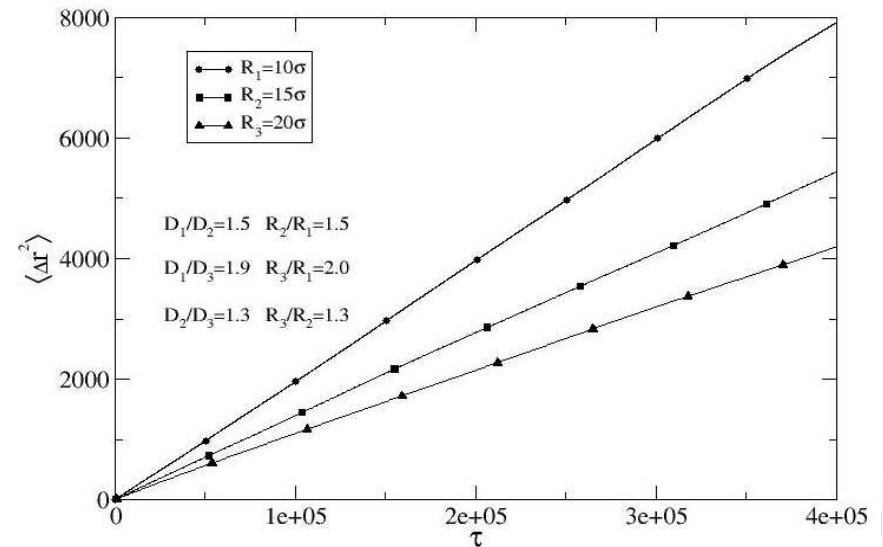
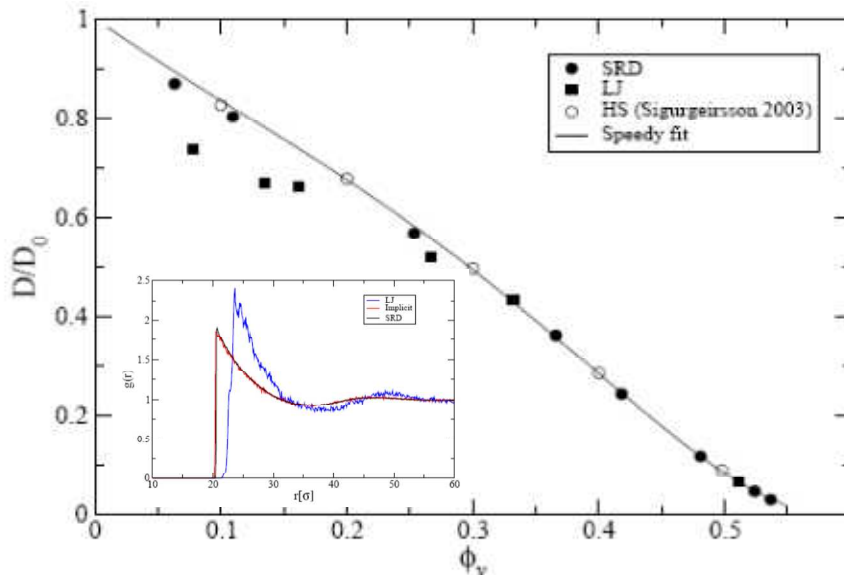
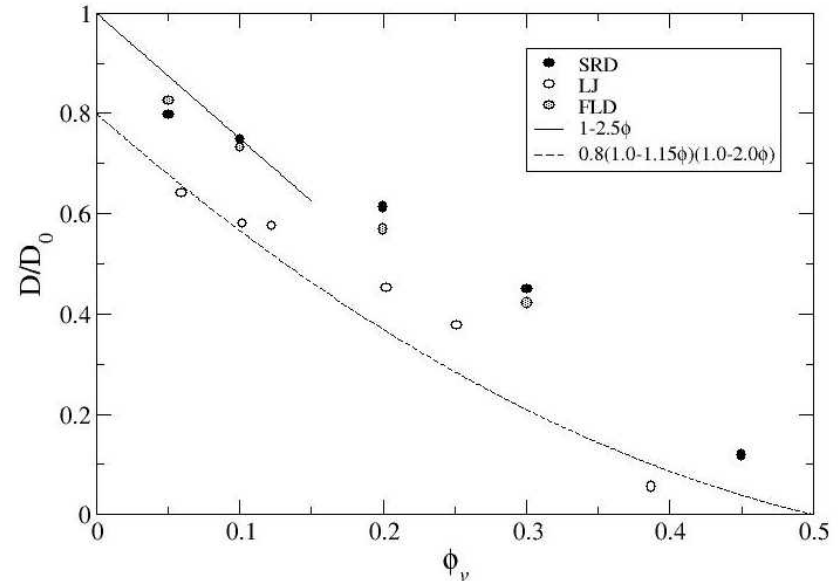
# Comparison of Pure LJ and SRD Solvents

- Solvent properties (LJ units)
  - $\rho_f = 0.6$
  - $k_B T = 1.0$
- Non-equilibrium low shear-rate (Muller-Plathe)
  - extrapolate to zero shear intercept
    - $v_{meas,LJ} = 1.67$
    - Use to get SRD parameters
    - Measured SRD viscosity is as expected



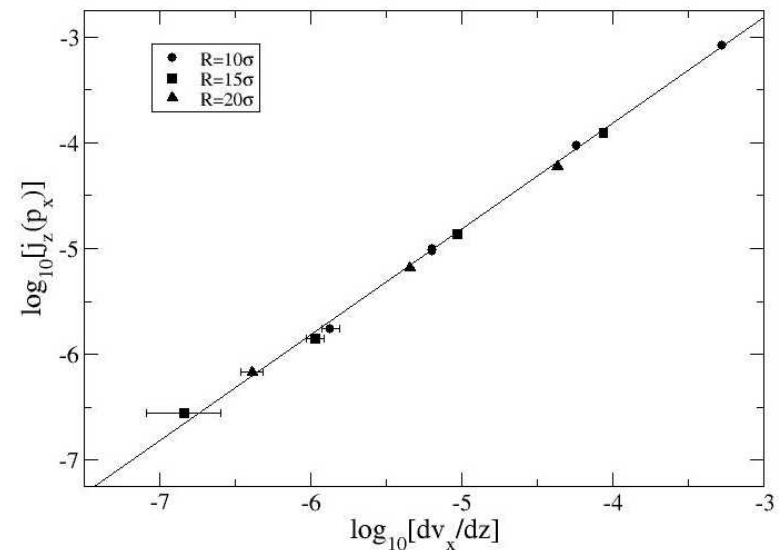
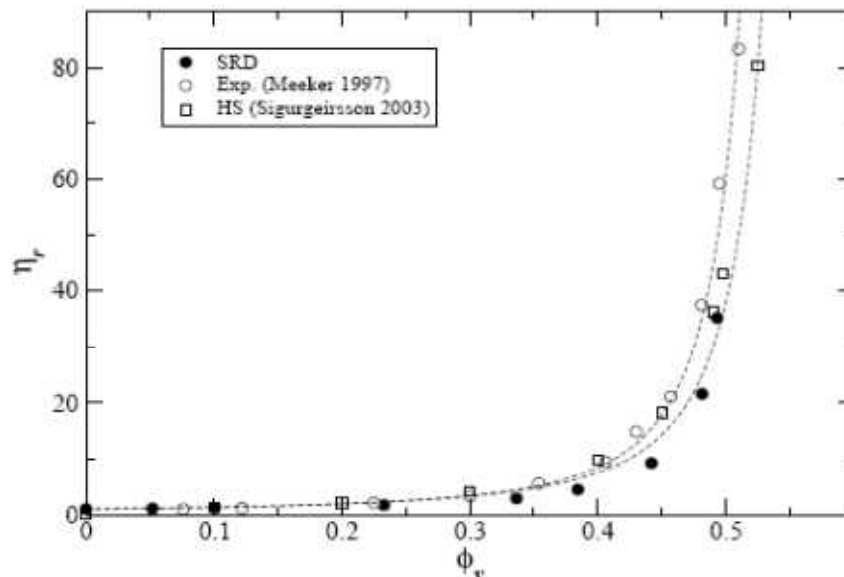
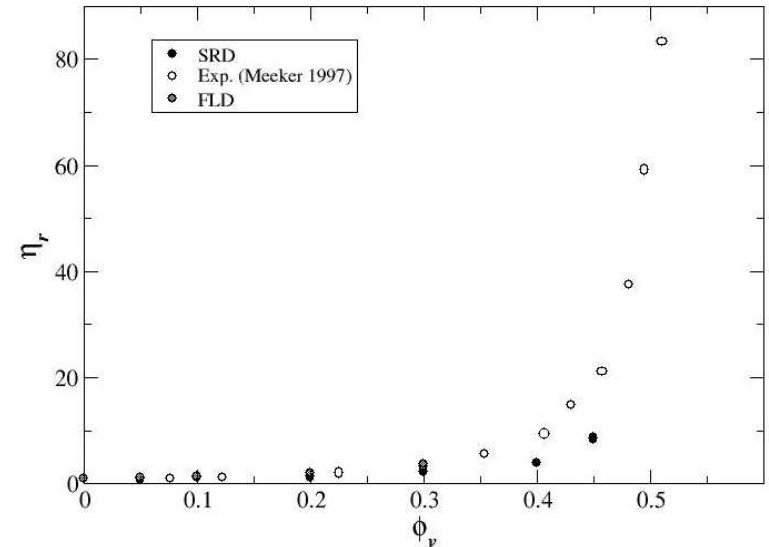
# Equilibrium: Colloid Diffusion

- Diffusion as a function of volume fraction of  $d = 20\sigma$  colloids
  - Comparison to explicit LJ solvent results
  - Comparison to FLD
- MSD for three different sized colloids



# Non-equilibrium: Low Shear-rate Bulk Viscosity

- Reduced viscosity as a function of volume fraction of  $d = 20\sigma$  colloids
  - Comparison to FLD
  - Comparison to Experimental results of Meeker (1997)
- Total momentum flux as a function of shear rate for suspensions of different





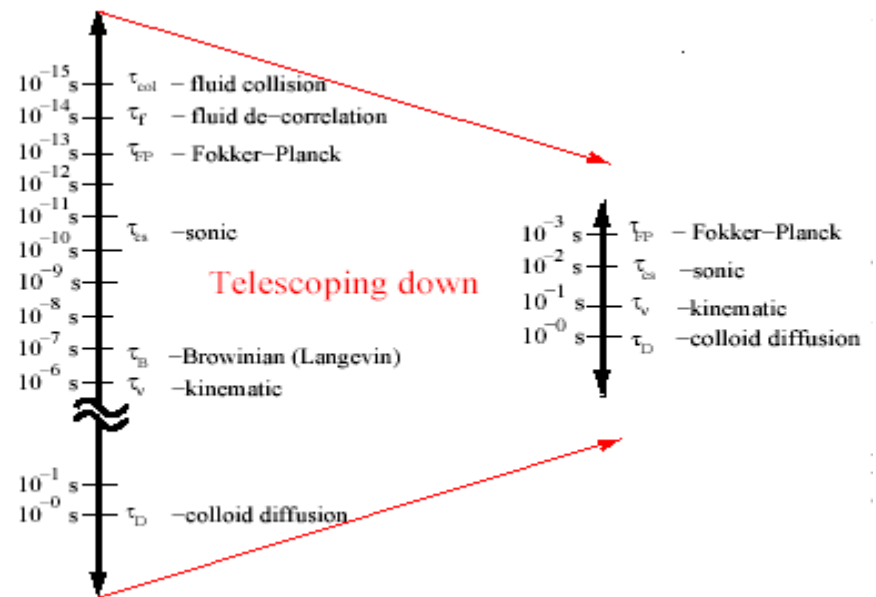
# Summary and Outlook

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- **Validation with literature results almost complete**
  - Some “punch-list” items being wrapped up
- **Validation with NPFC Model systems ongoing**
  - See Randy and Matt P.
- **Extend Method for**
  - Solvent removal: EISA
  - Phase separating, multi-component systems
  - Viscoelastic solvents



$$\tau_v = \frac{4R^2}{v_{sim}}$$



Time scales for 1  $\mu\text{m}$  colloid in water.  
 From Padding and Louis (2006) cond-mat/0603391