

Modified kinetic theory for flows of frictional granular materials

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Motivation



- Granular flows commonly modeled using kinetic theory
- Existing kinetic theories are valid for:
 - ▶ frictionless particles
 - ▶ low to moderate solids fractions
- However, granular materials are frictional and often densely packed
- Goal: To modify an existing kinetic theory[†] to handle dense frictional flows

[†]Garzó, V., Dufty, J.W. Phys. Rev. E 59, 5895 (1999).

Kinetic theory equations



Garzó-Dufty kinetic theory for simple shear flow

Pressure

$$p = \rho_s \phi [1 + 2(1 + e)\phi g_0] T$$

Shear stress

$$\tau = \left(\frac{2J}{5\sqrt{\pi}} \right) \frac{pd\dot{\gamma}}{F\sqrt{T}}$$

Energy dissipation rate

$$\Gamma = \frac{12}{\sqrt{\pi}} \frac{\rho\phi g_0}{d} (1 - e^2) T^{3/2}$$

Steady-state energy balance

$$\Gamma - \dot{\gamma}\tau = 0$$

$$F = F(e, \phi)$$

$$J = J(e, \phi)$$

Kinetic theory equations



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Important quantities:

- Radial distribution function at contact $g_0 = g_0(\phi)$
 - ▶ Measure of packing
 - ▶ Diverges at random close packing
- Restitution coefficient e
 - ▶ Measure of dissipation
 - ▶ Has strong effect on temperature

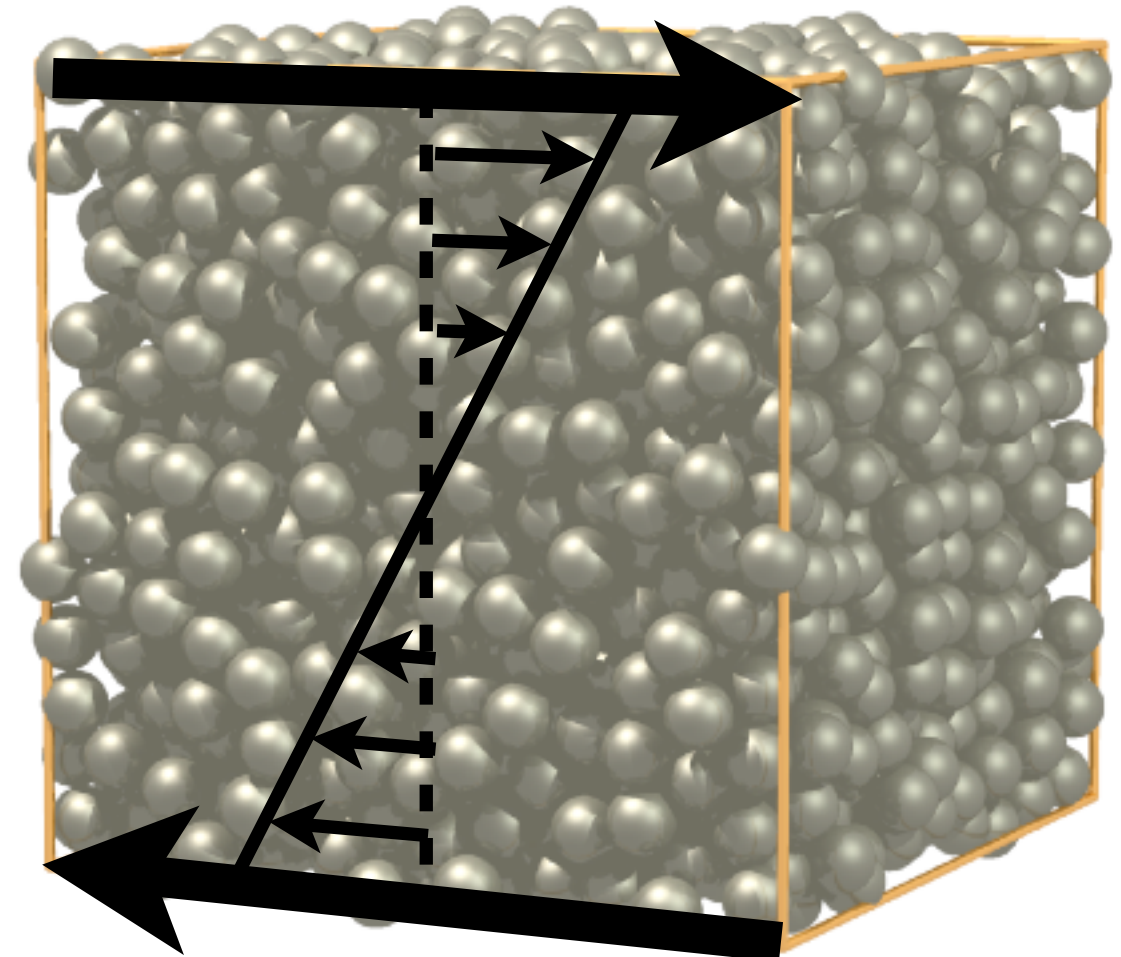
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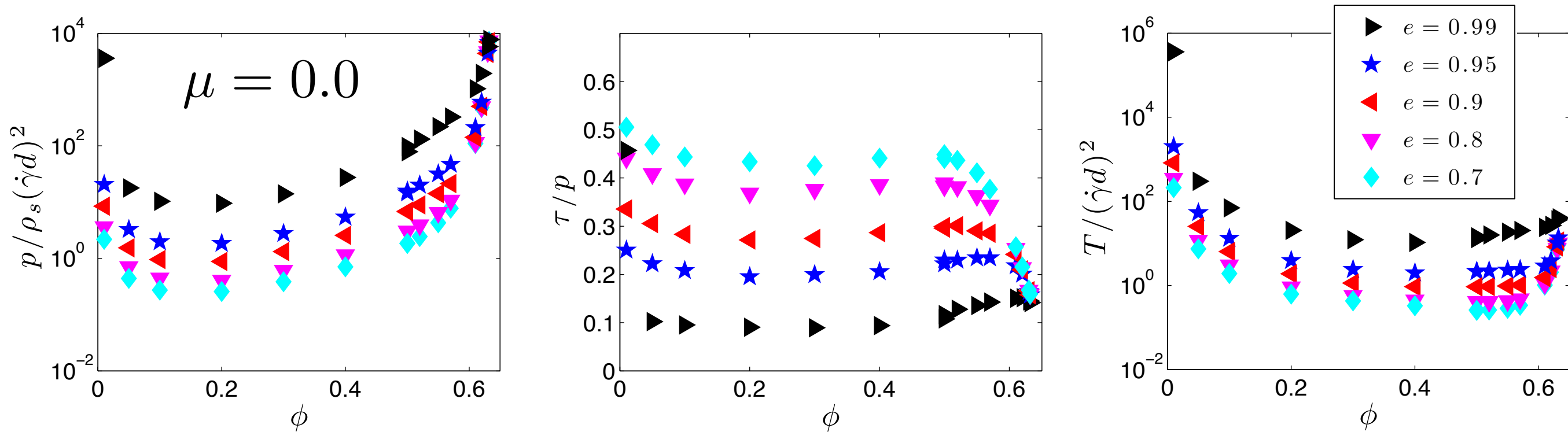
Computational methodology



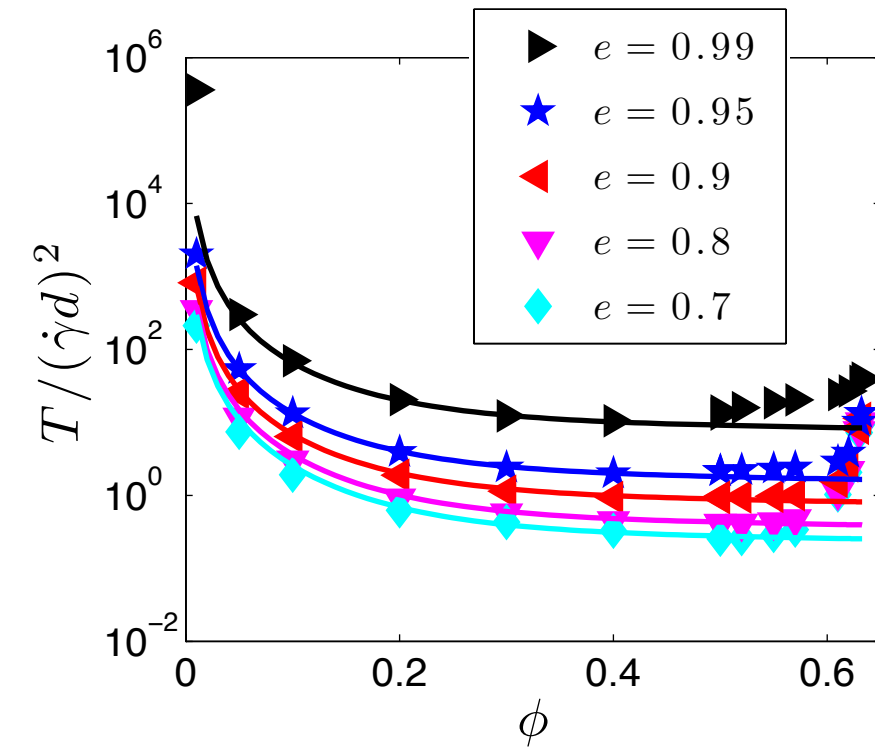
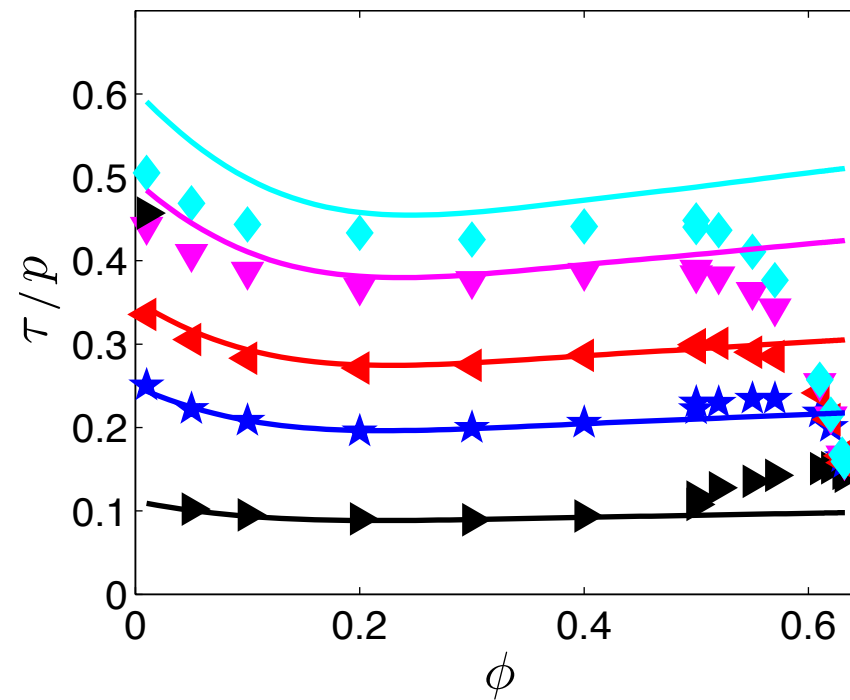
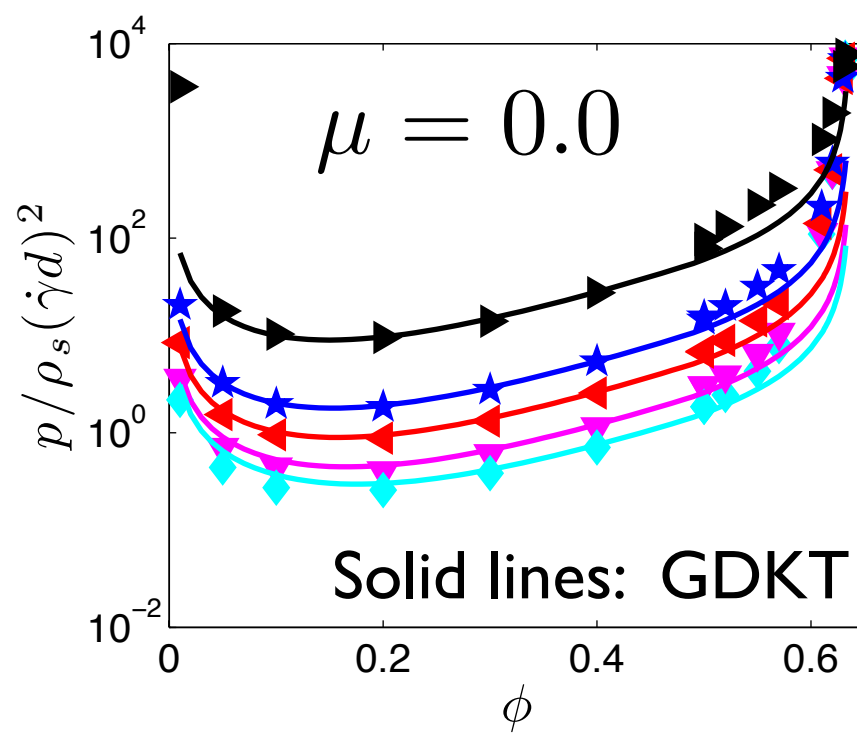
- Simulate particle dynamics of homogeneous assemblies under simple shear using discrete element method (DEM).
 - ▶ Linear spring-dashpot with frictional slider.
 - ▶ 3D periodic domain without gravity
 - ▶ Lees-Edwards boundary conditions
- Extract stress and structural information by averaging.



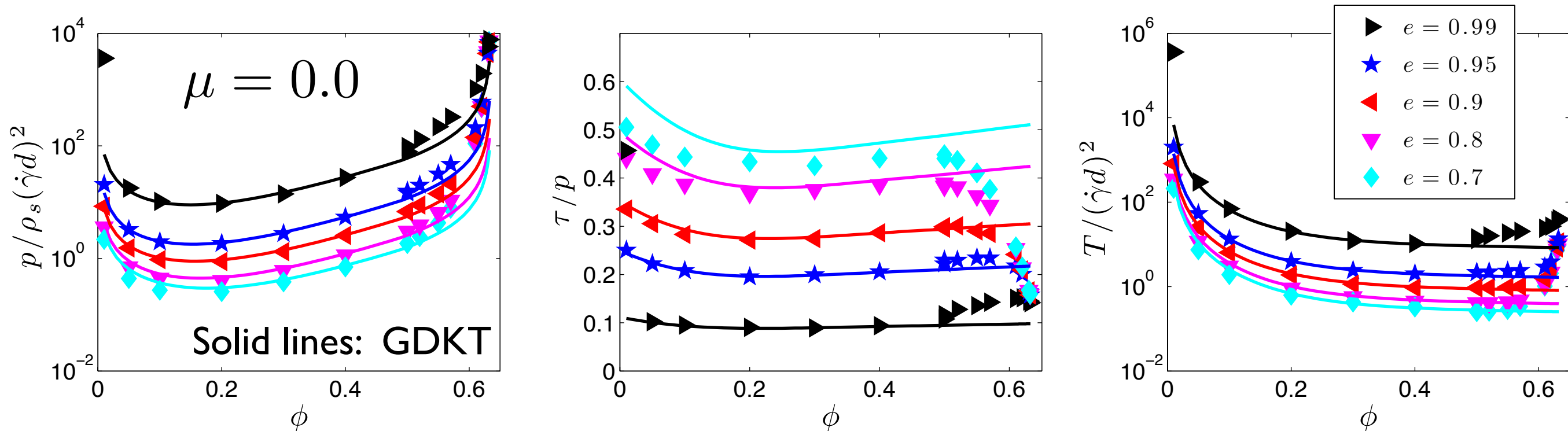
DEM results: without friction



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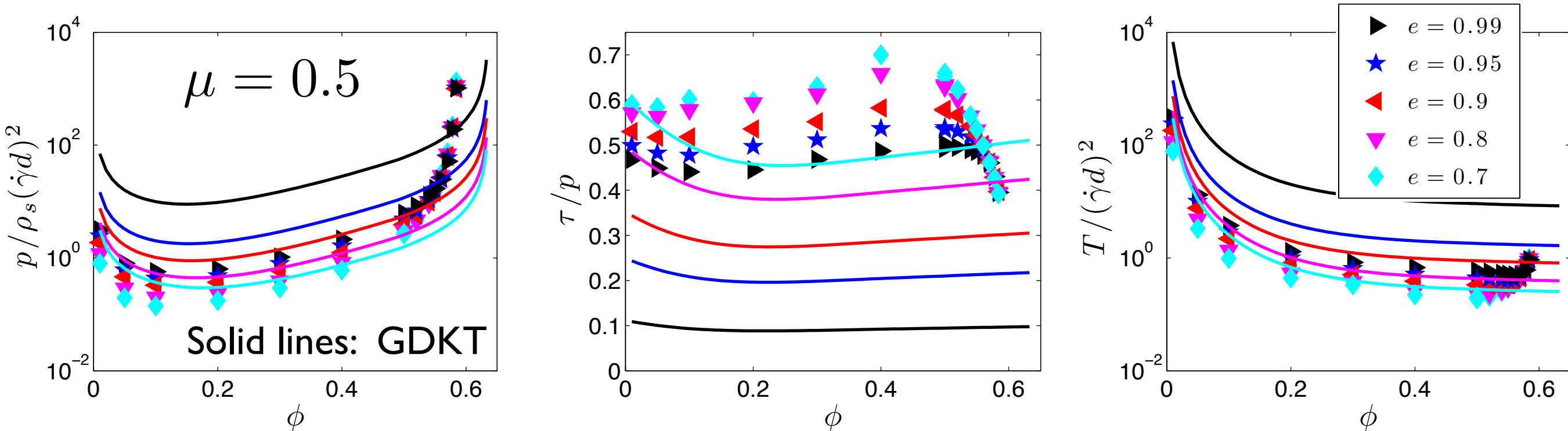


DEM results: without friction



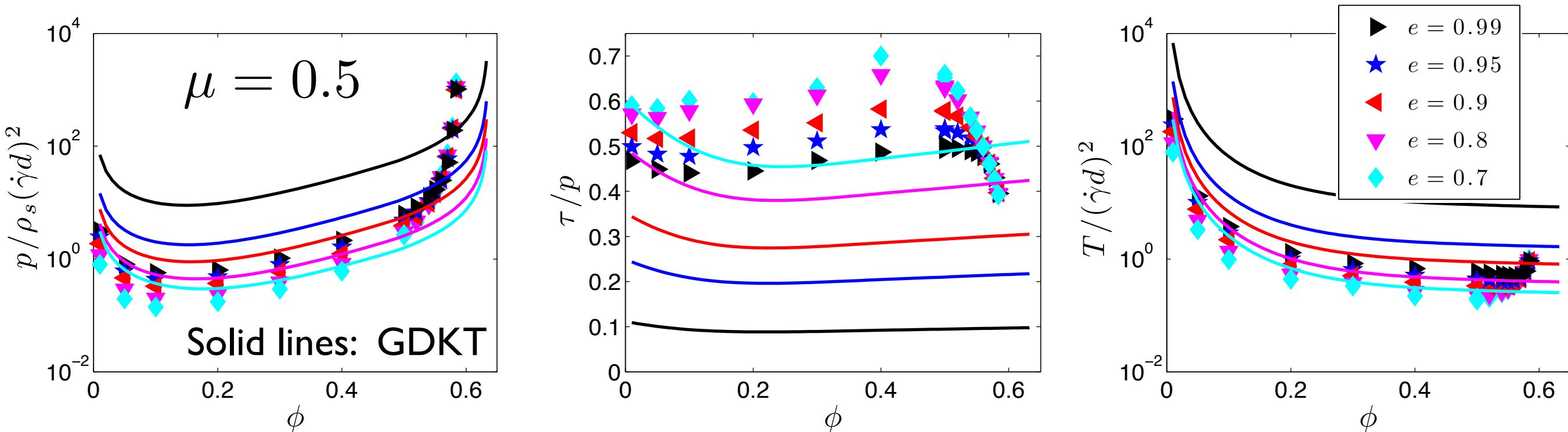
- GD theory agrees with DEM results for dilute systems
- GD theory fails for dense systems
 - ▶ Predicts incorrect scaling of pressure with volume fraction
 - ▶ Cannot predict yield stress in close-packed limit
 - ▶ Derived from false assumption of uncorrelated, isotropically-distributed collisions

DEM results: with friction



- GD theory fails to capture DEM results for frictional particles
 - ▶ Increased collisional stress in dense regime
 - ▶ Increased dissipation in dilute regime

DEM results: with friction



- GD theory fails to capture DEM results for frictional particles
 - ▶ Increased collisional stress in dense regime
 - ▶ Increased dissipation in dilute regime
- Possible modifications
 - ▶ Modified RDF at contact $g_0 = g_0(\phi, e, \mu) \longrightarrow p$
 - ▶ Effective restitution coefficient[†] $e_{\text{eff}} = e_{\text{eff}}(e, \mu) \longrightarrow T$
 - ▶ Correction factors^{*} $\delta_i = \delta_i(\phi, e, \mu) \longrightarrow \tau/p$

[†]Jenkins, J.T. and Zhang, C. Phys. Fluids 14, 1228 (2002).

^{*}Jenkins, J.T. and Berzi, D. Granul. Matter 12, 151 (2010).

Effective restitution coefficient



- Can use dilute regime temperature to calculate effective restitution coefficient

$$T = \frac{2J(\dot{\gamma}d)^2}{15(1 - e^2)} \implies e_{\text{eff}} = \sqrt{1 - \frac{2J(\dot{\gamma}d)^2}{15T}}$$

Effective restitution coefficient



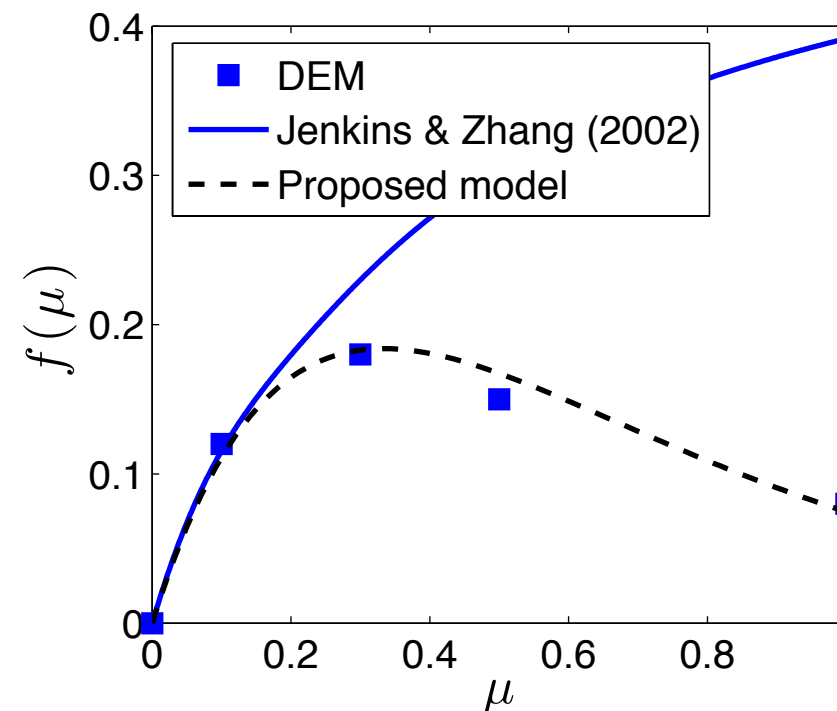
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- Proposed form:

$$e_{\text{eff}} = e - f(\mu)$$

$$f(\mu) = 1.5\mu e^{-3\mu}$$



Effective restitution coefficient



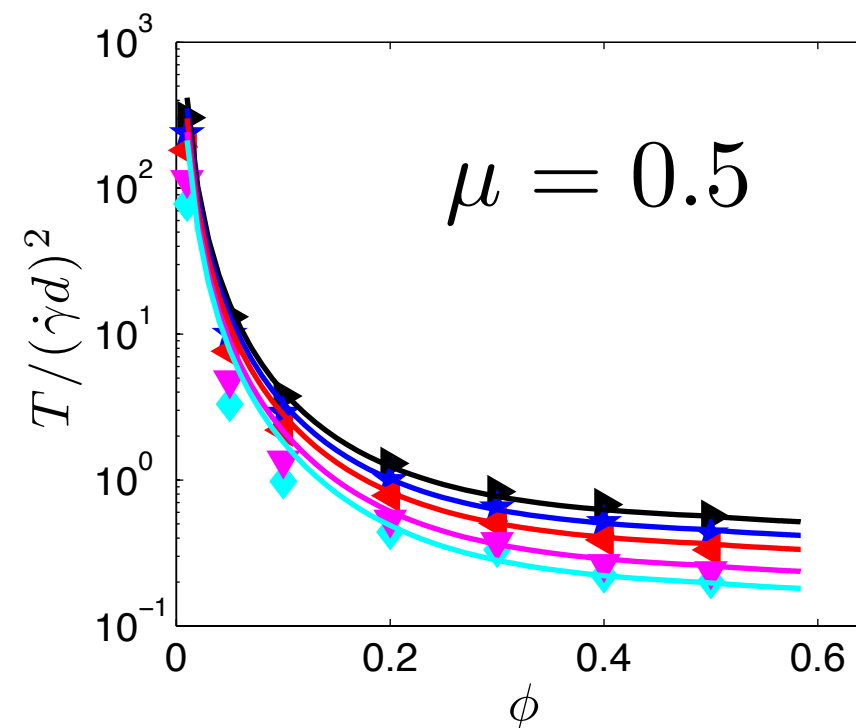
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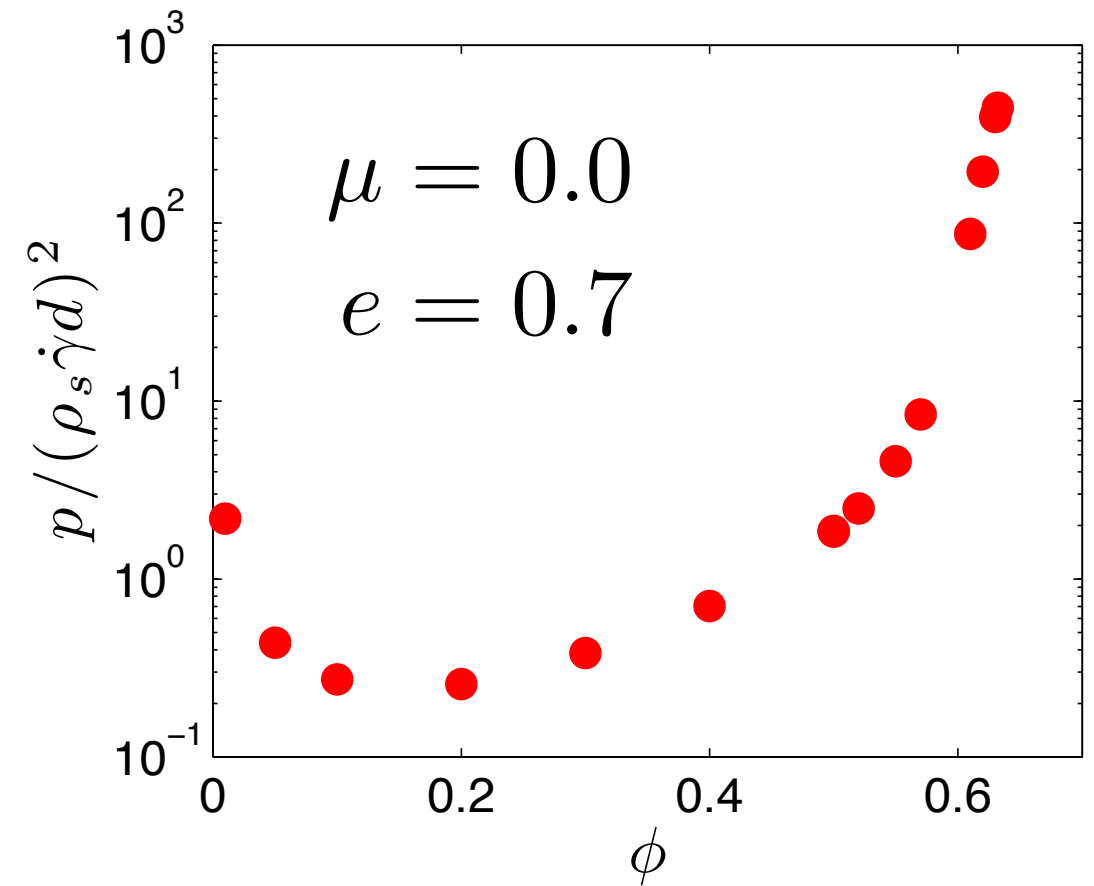
- Can capture temperature for frictional systems

Radial distribution function: no friction



- Pressure

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Radial distribution function: no friction



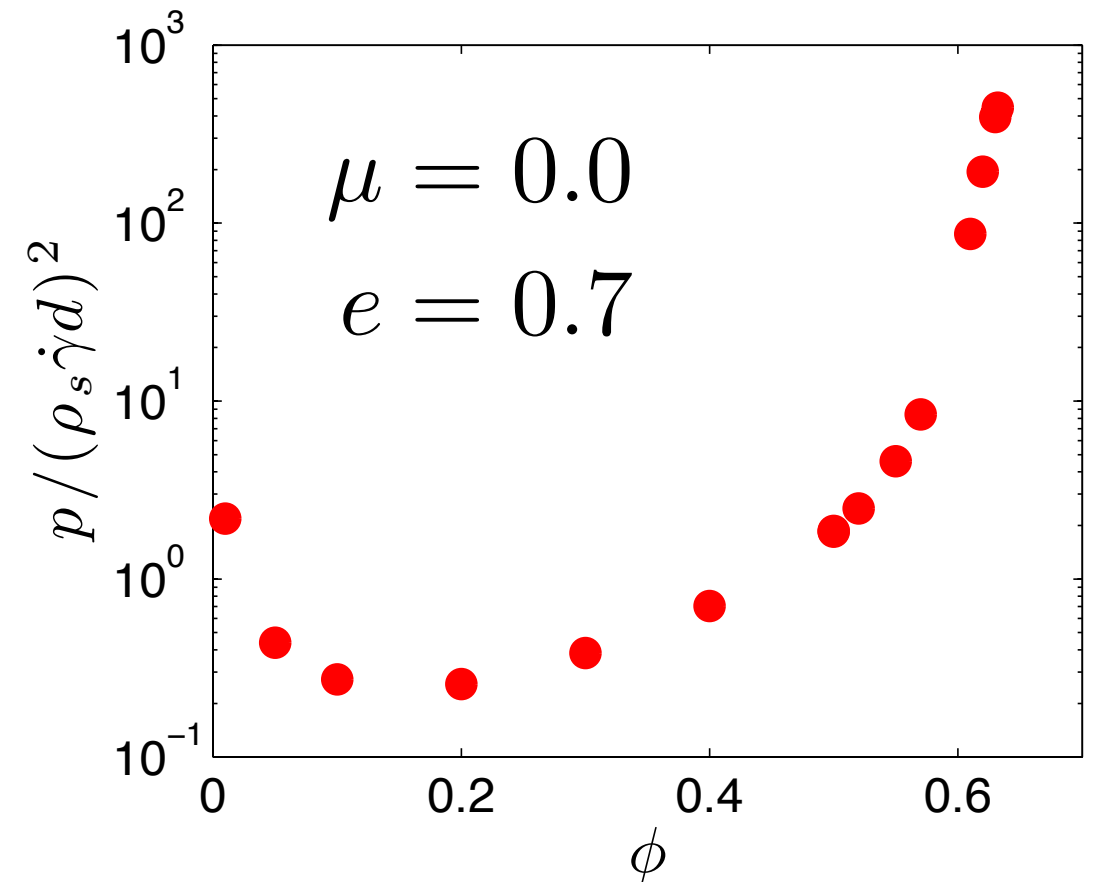
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- Radial distribution function

- ▶ Carnahan-Starling[†]:

$$g_0^{CS} = \frac{1 - \phi/2}{(1 - \phi)^3}$$



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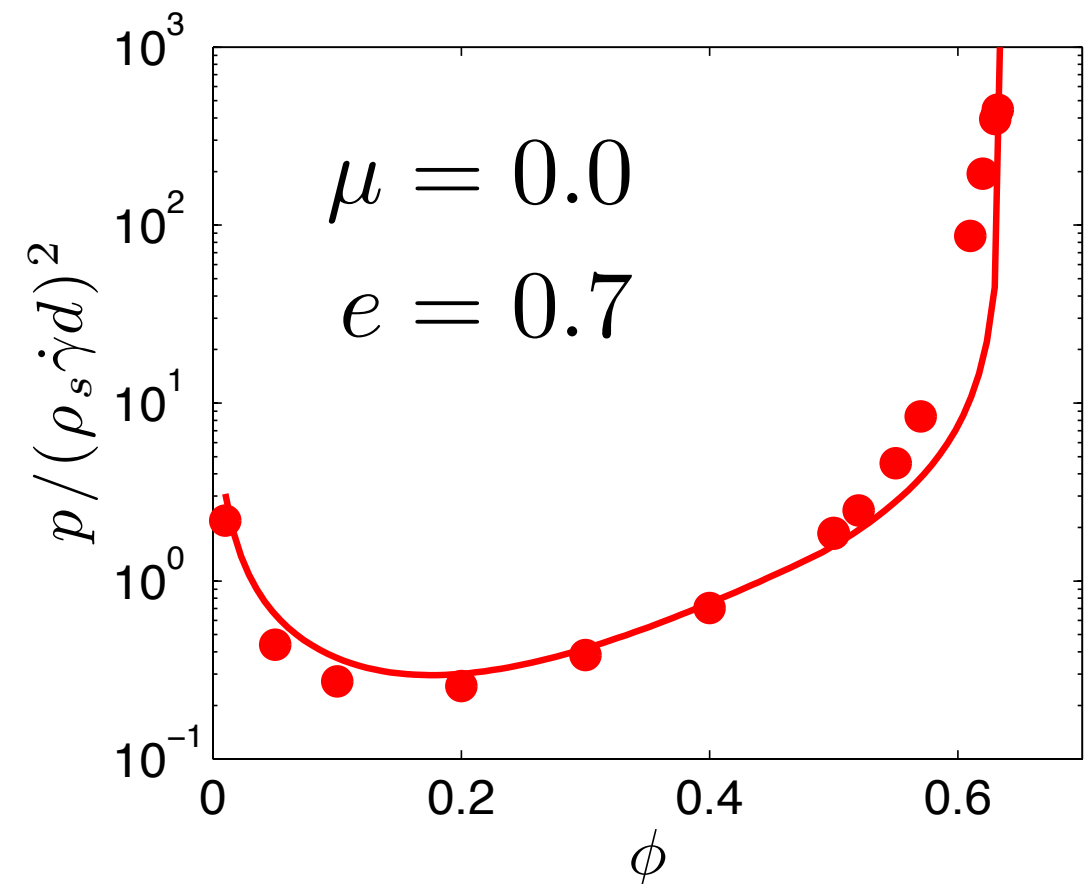
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$$g_0 = \begin{cases} g_0^{CS}(\phi), & \phi \leq \phi_f \\ g_0^{CS}(\phi_f) \frac{\phi_c - \phi_f}{\phi_c - \phi}, & \phi > \phi_f \end{cases}$$



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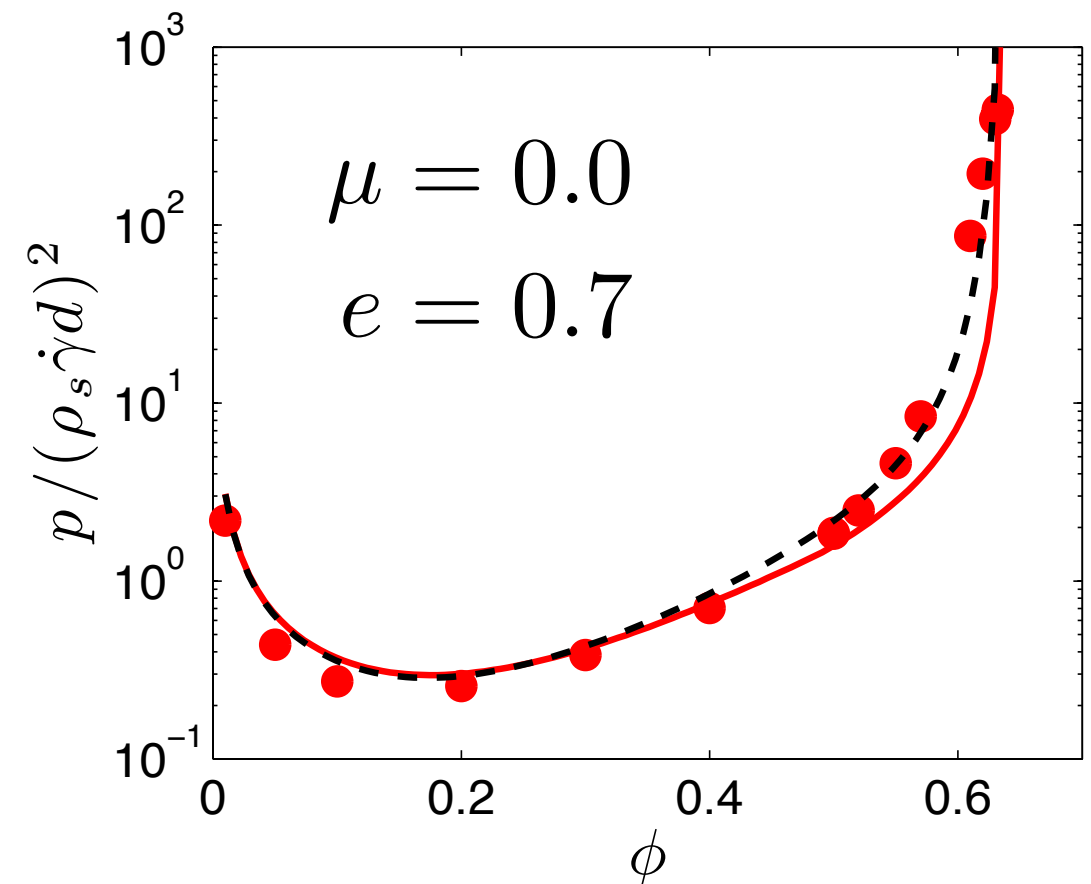
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$$g_0 = g_0^{CS} + \frac{\alpha(e, \mu)\phi^2}{(\phi_c - \phi)^2}$$



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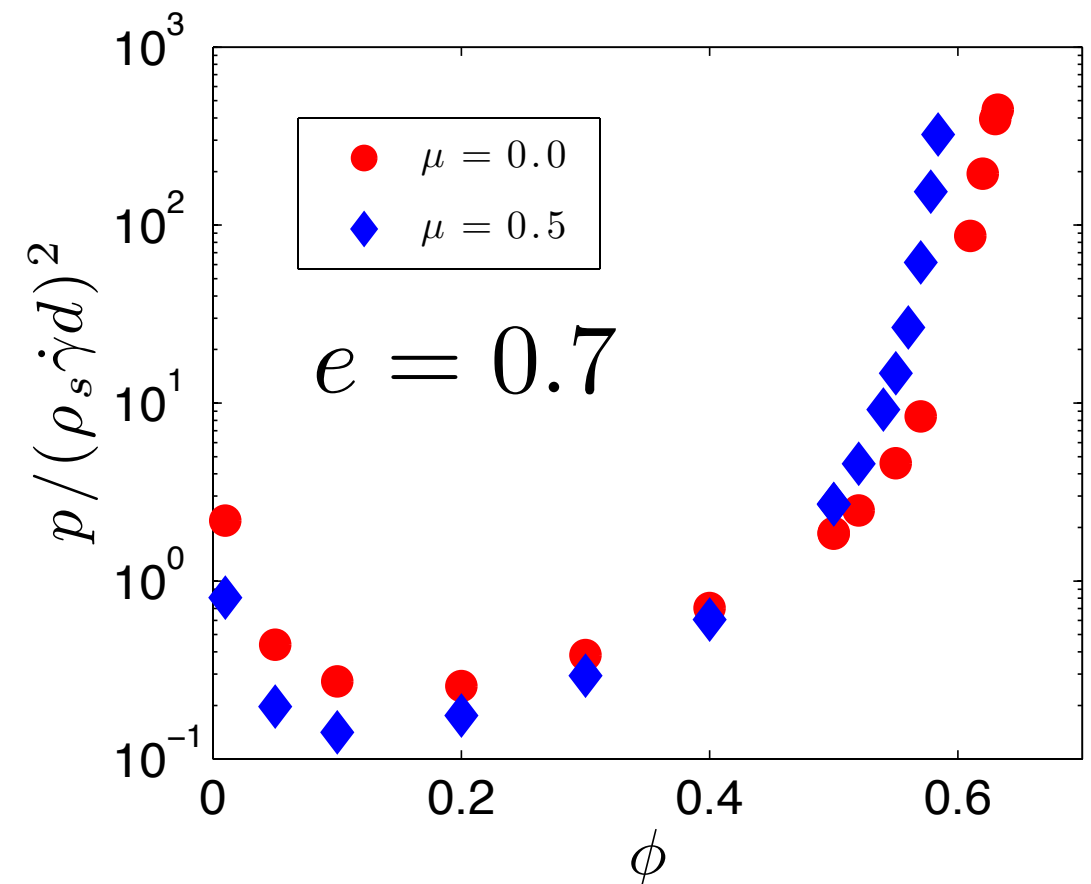
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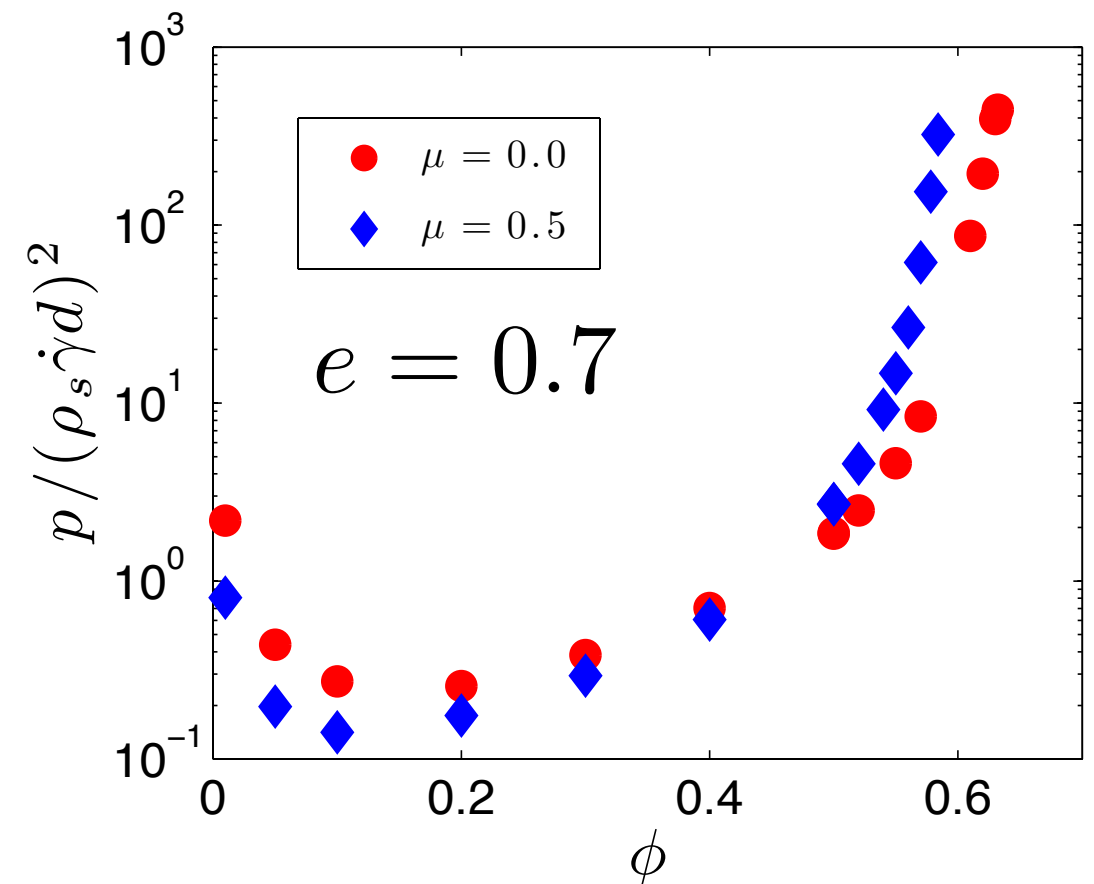
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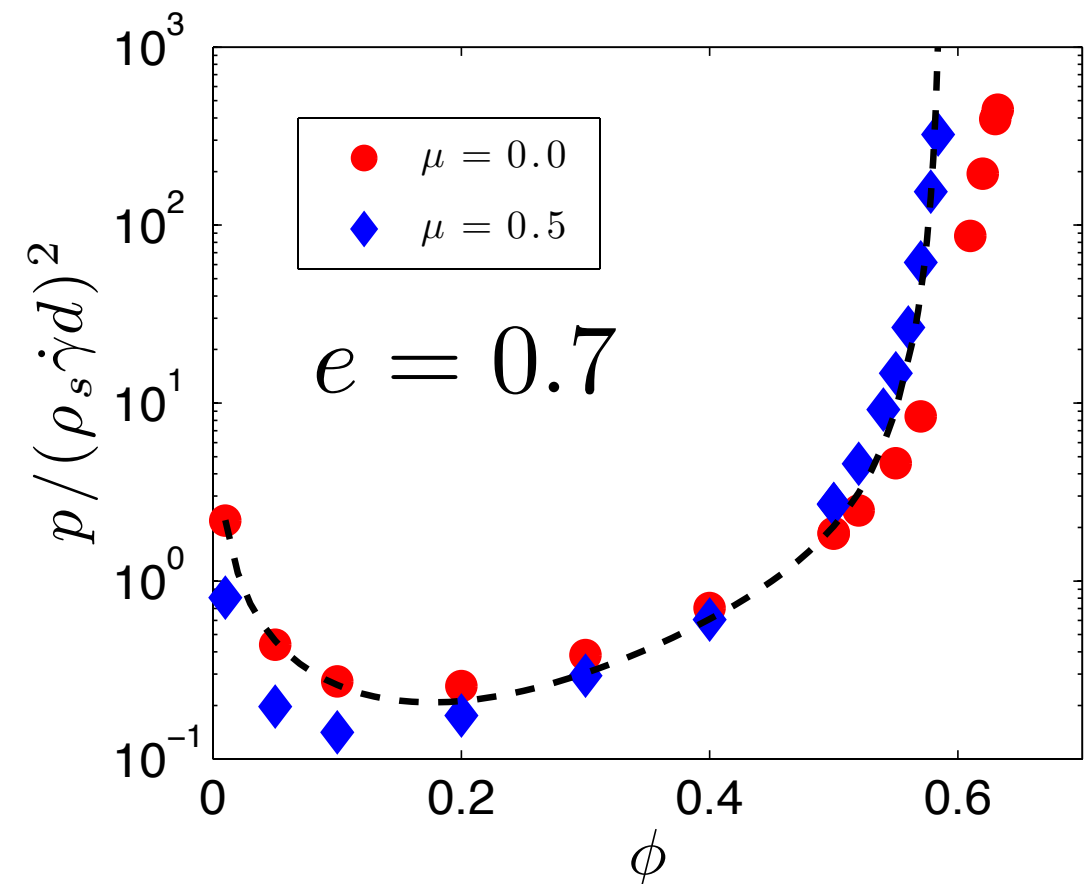
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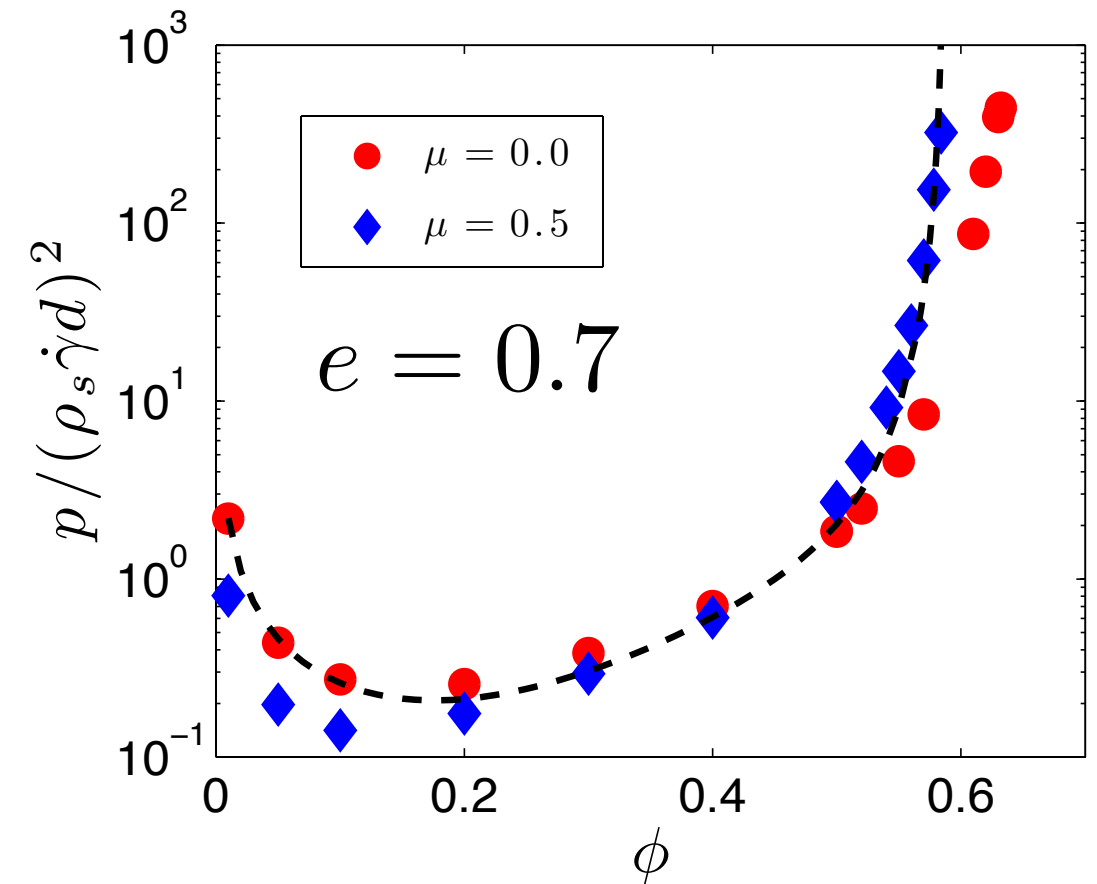
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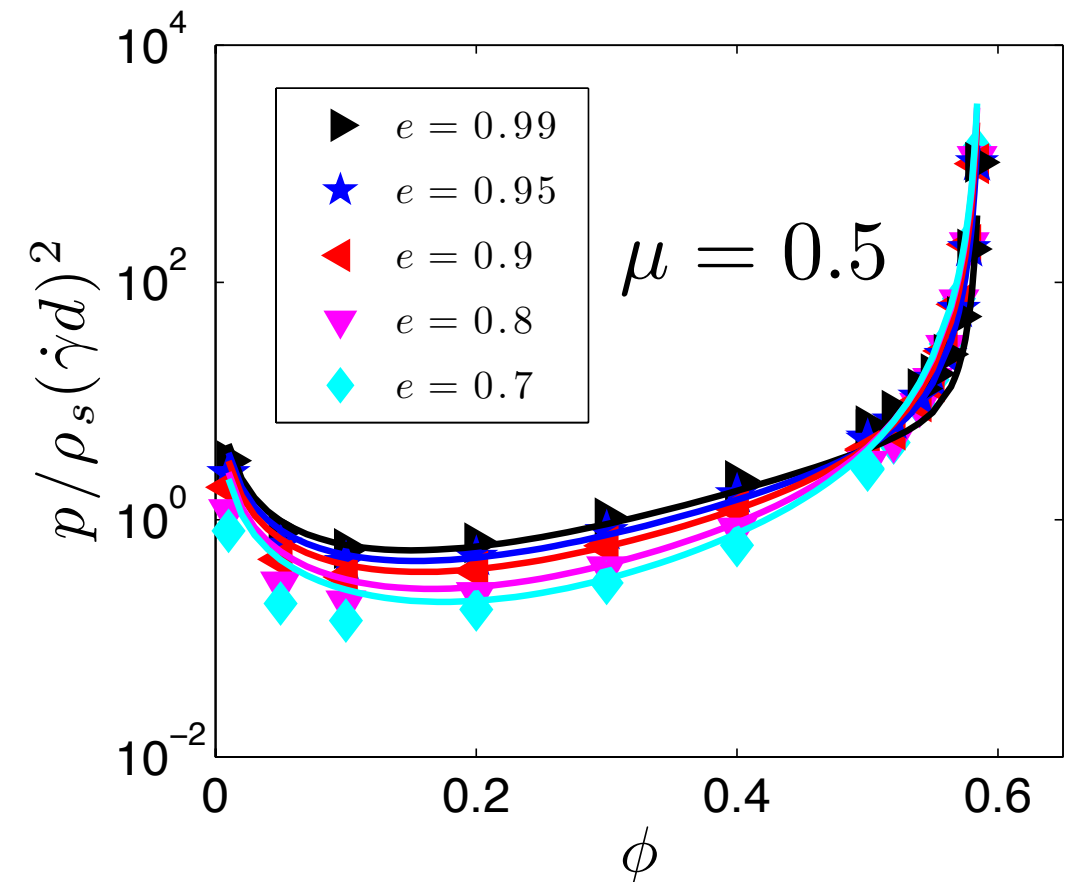
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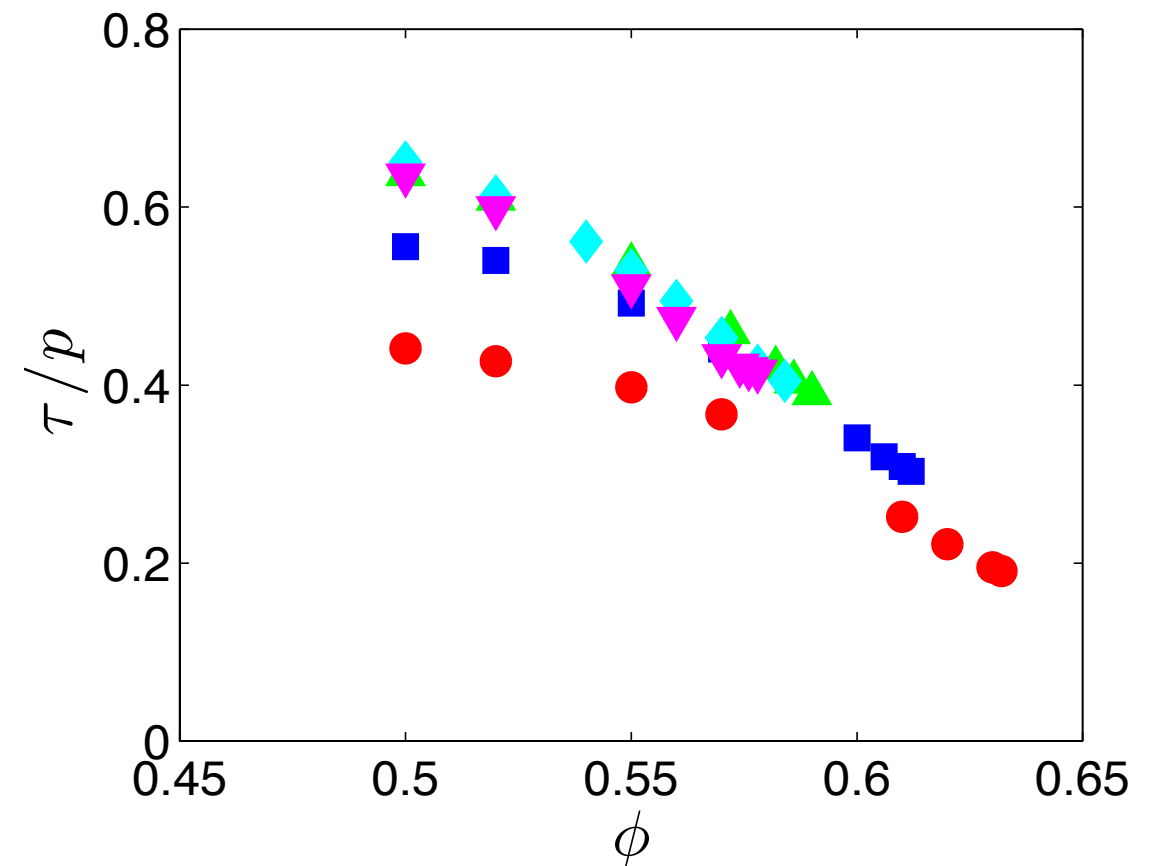
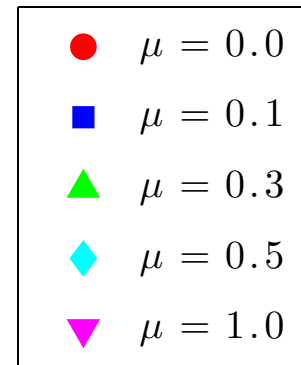
Shear stress ratio for dense regime

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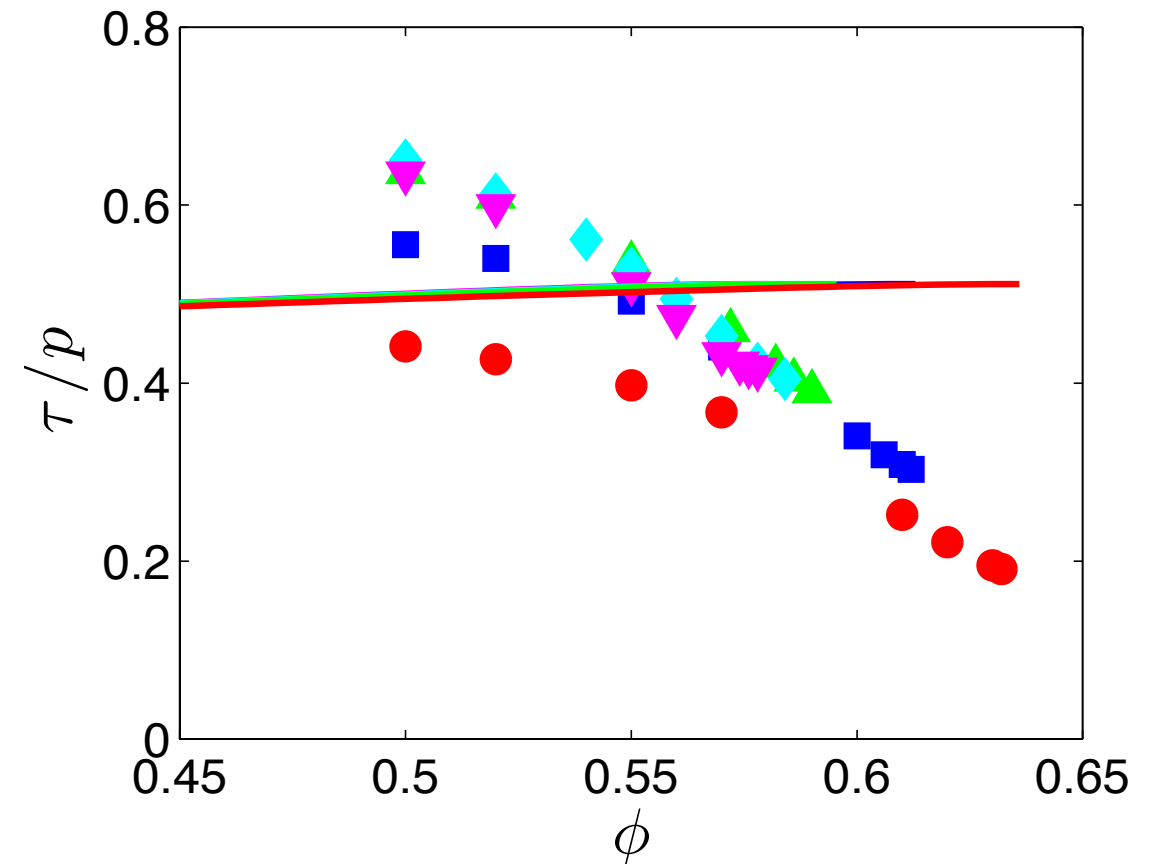
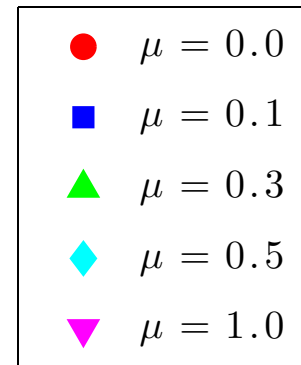
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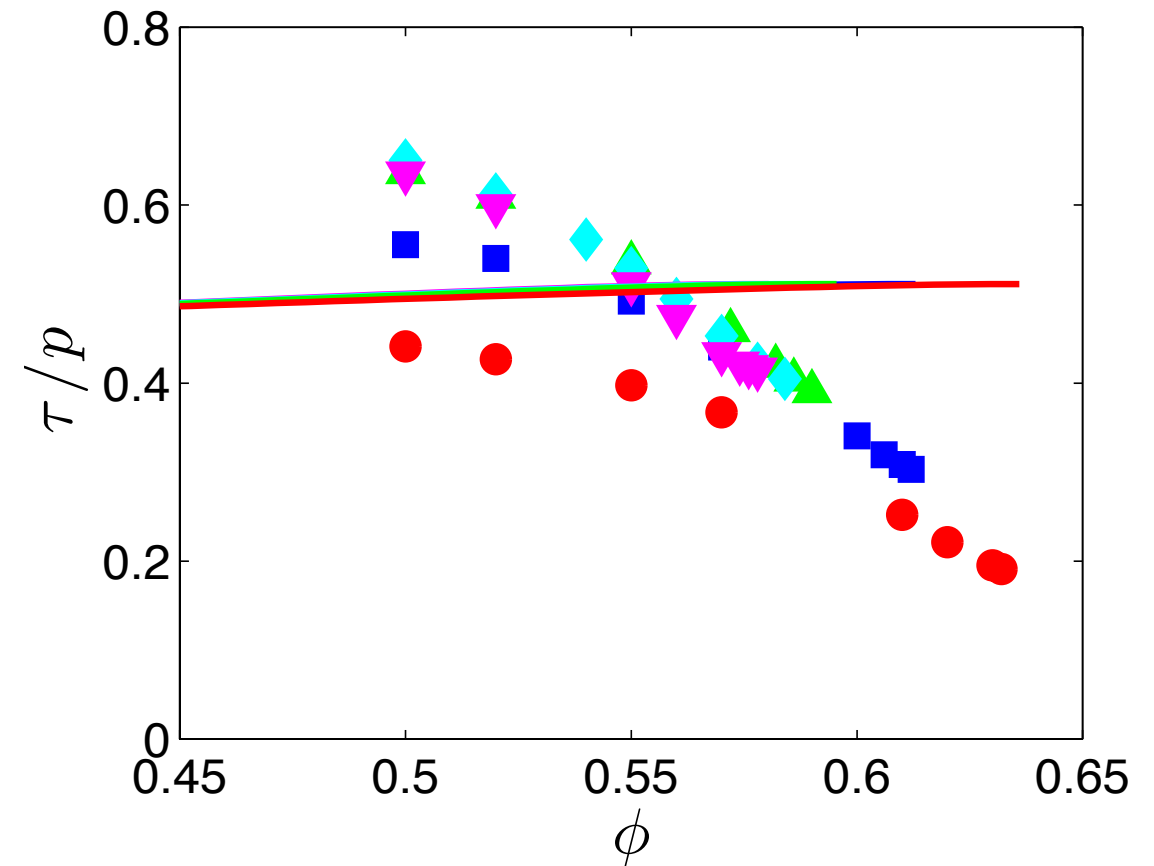
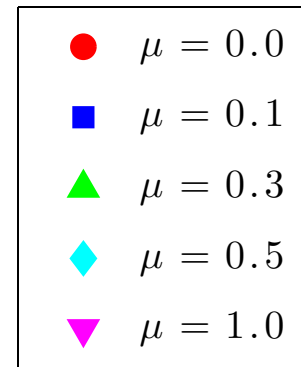
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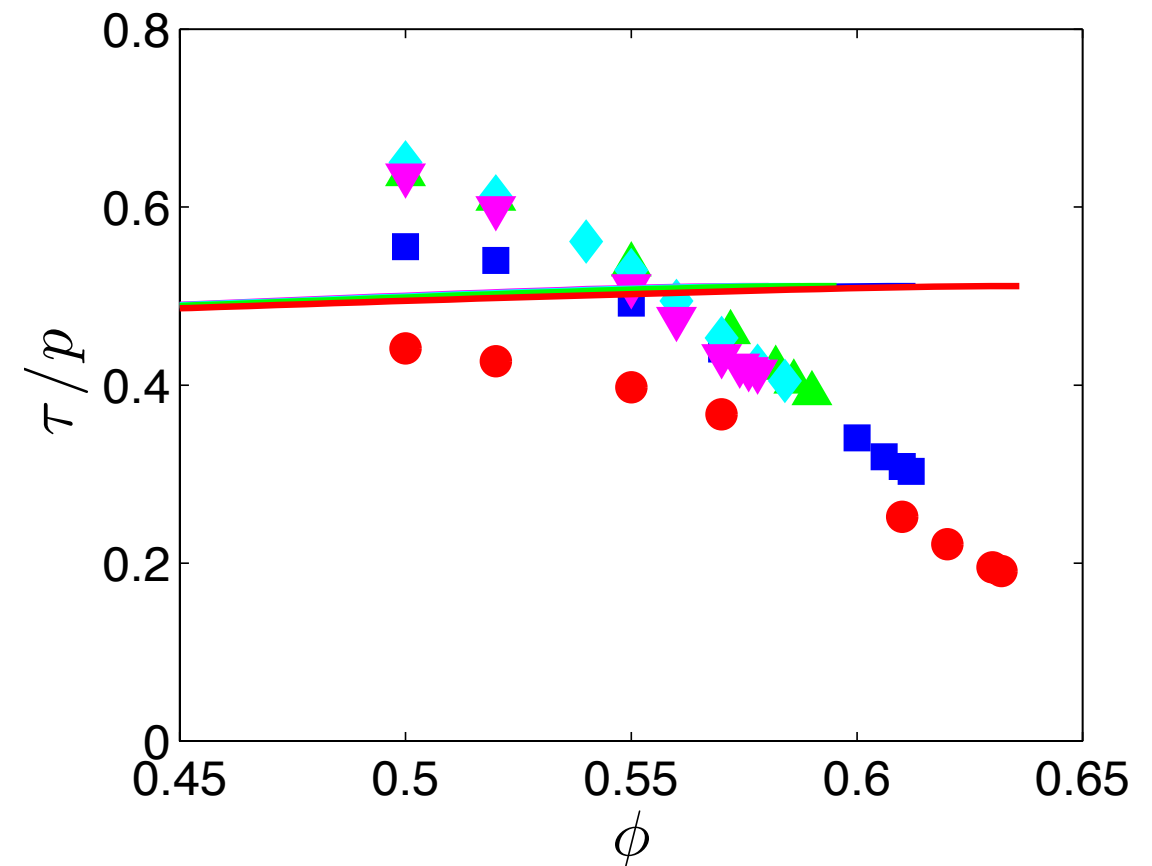
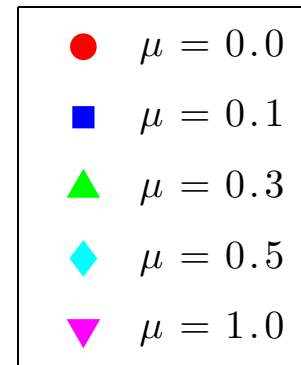
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d
↙ Length scale



Shear stress ratio for dense regime

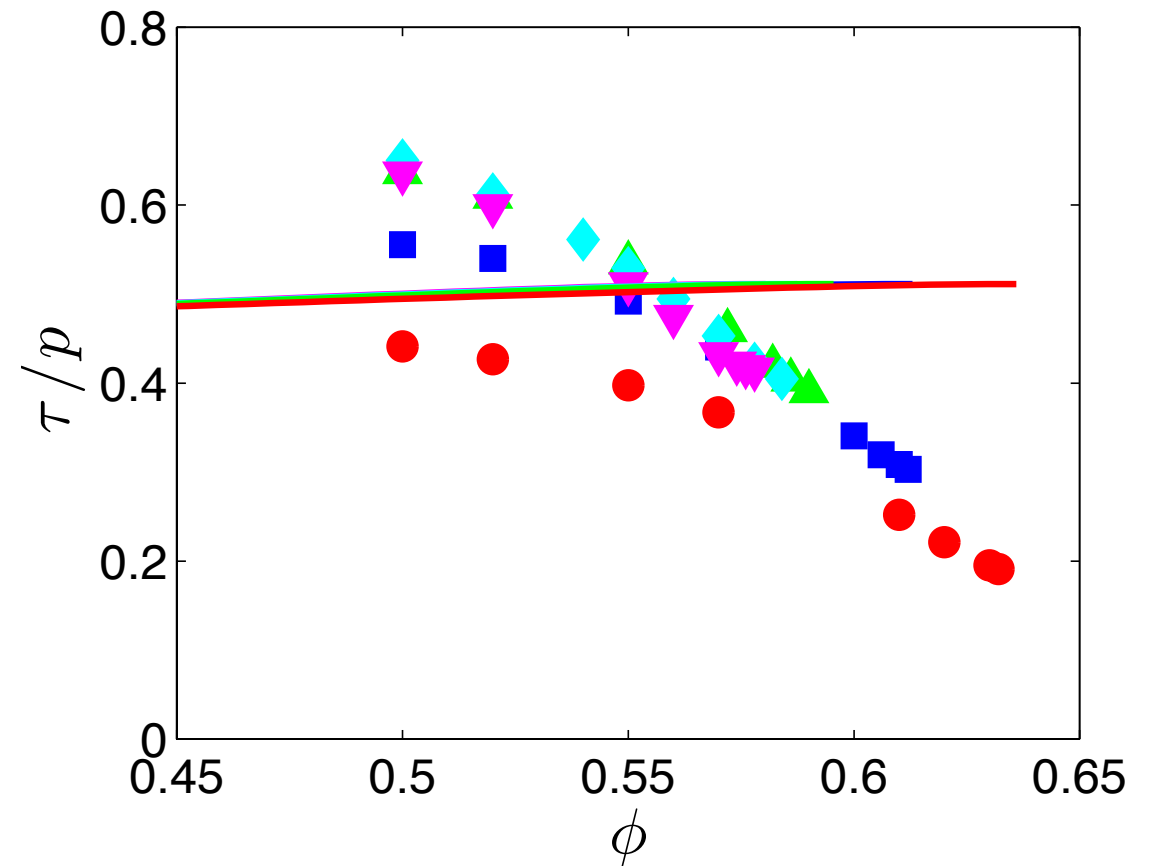
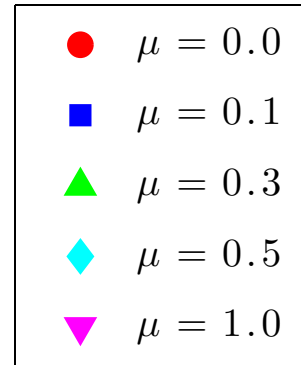
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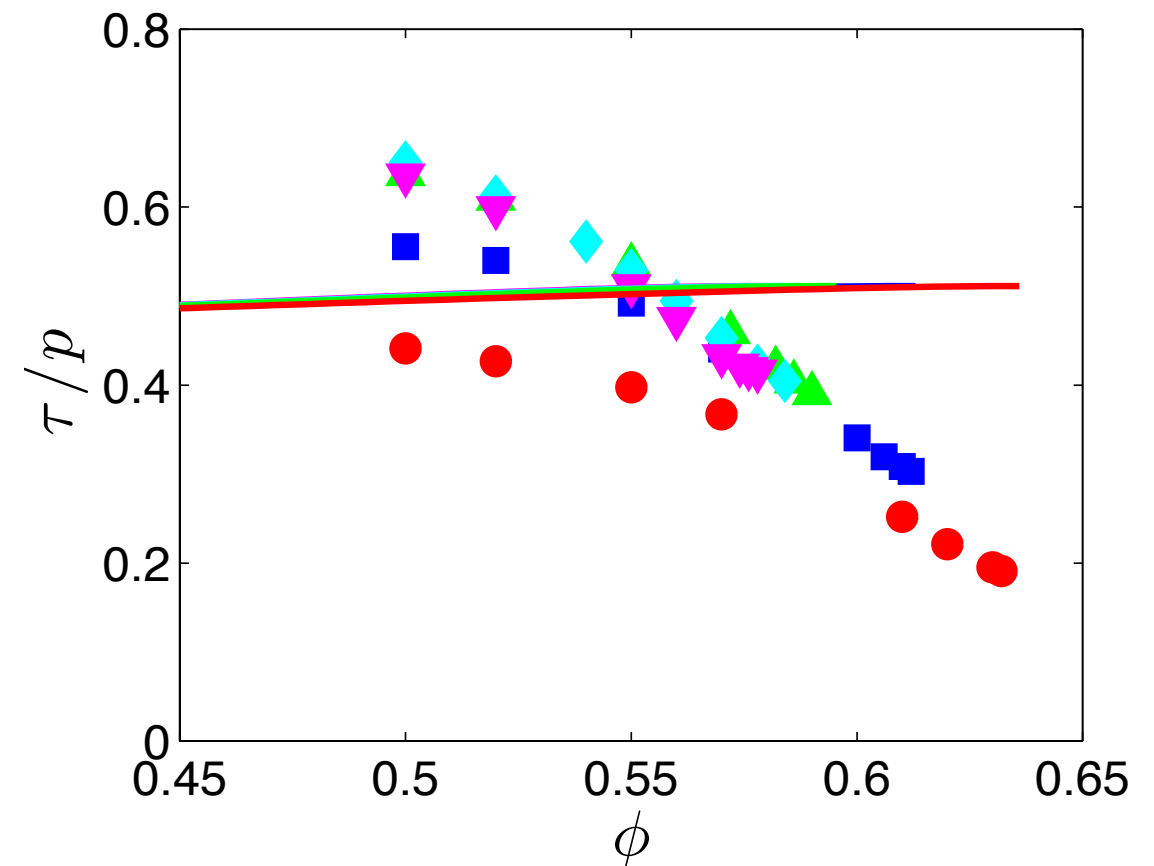
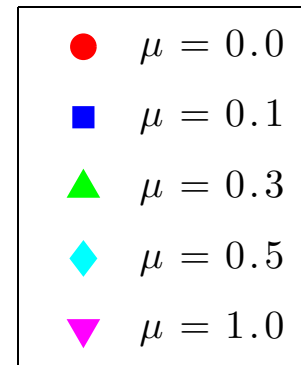
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Length scale

$$\frac{L}{d} = \frac{1}{2} \hat{c} G^{1/3} \frac{\dot{\gamma} d}{\sqrt{T}}$$



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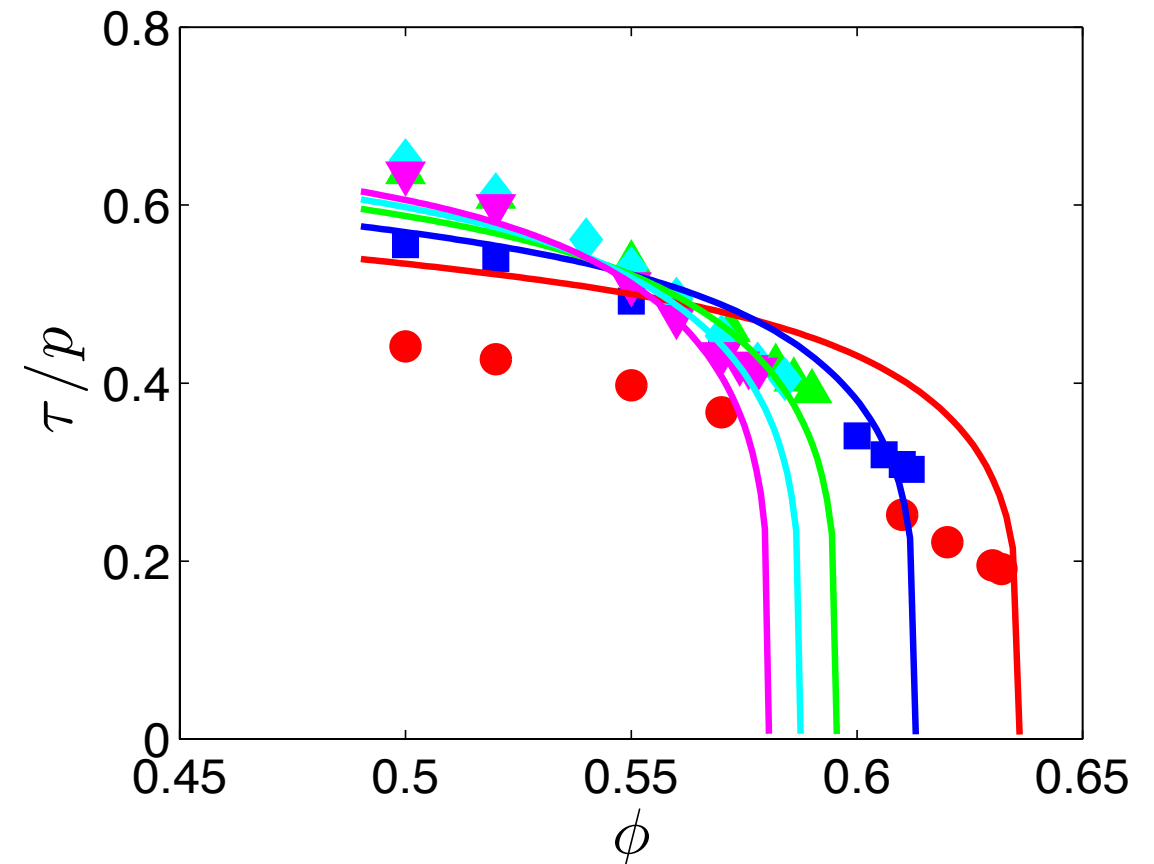
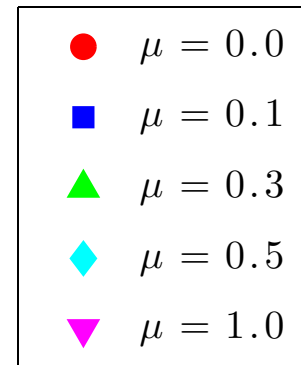
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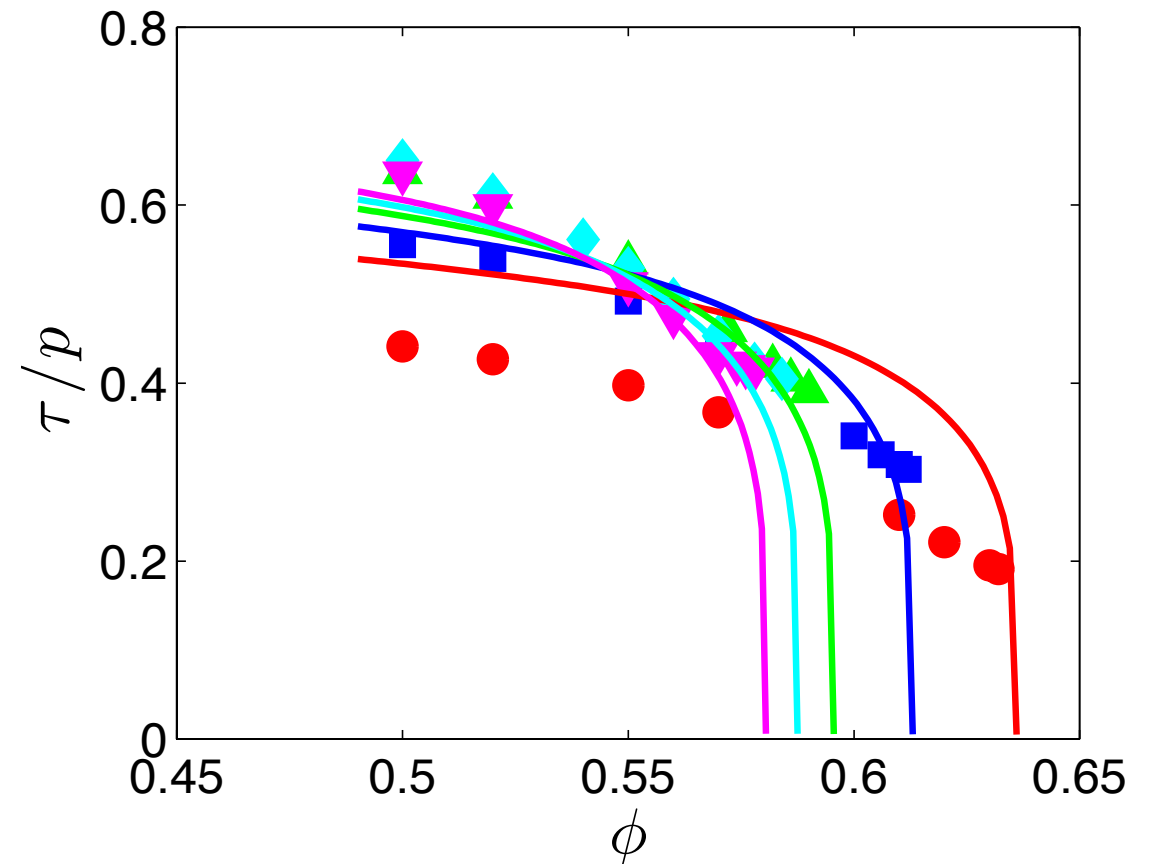
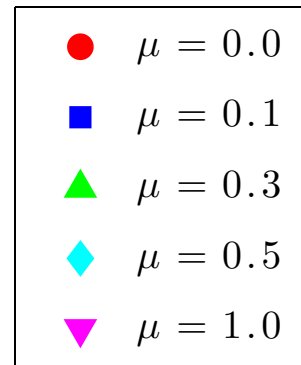
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- Undesirable features:

- ▶ Does not predict a yield stress ratio η_s
- ▶ Temperature diverges at ϕ_c

Modifications for dense regime



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Modifications for dense regime



- Our proposed model:

$$p = \rho_s \phi [1 + 4\eta\phi g_0] T$$

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Steady-state:

$$\Gamma - \dot{\gamma} \tau = 0$$

Modifications for dense regime



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$$\eta = \eta(I) = \eta_s + \frac{\alpha_2}{\left(\frac{I_0}{I}\right)^{1.5} + 1} \implies \delta = \frac{\eta(I)}{\eta_{KT,SS}}$$

$$I \equiv \frac{\dot{\gamma}d}{\sqrt{p/\rho_s}}$$

Modifications for dense regime

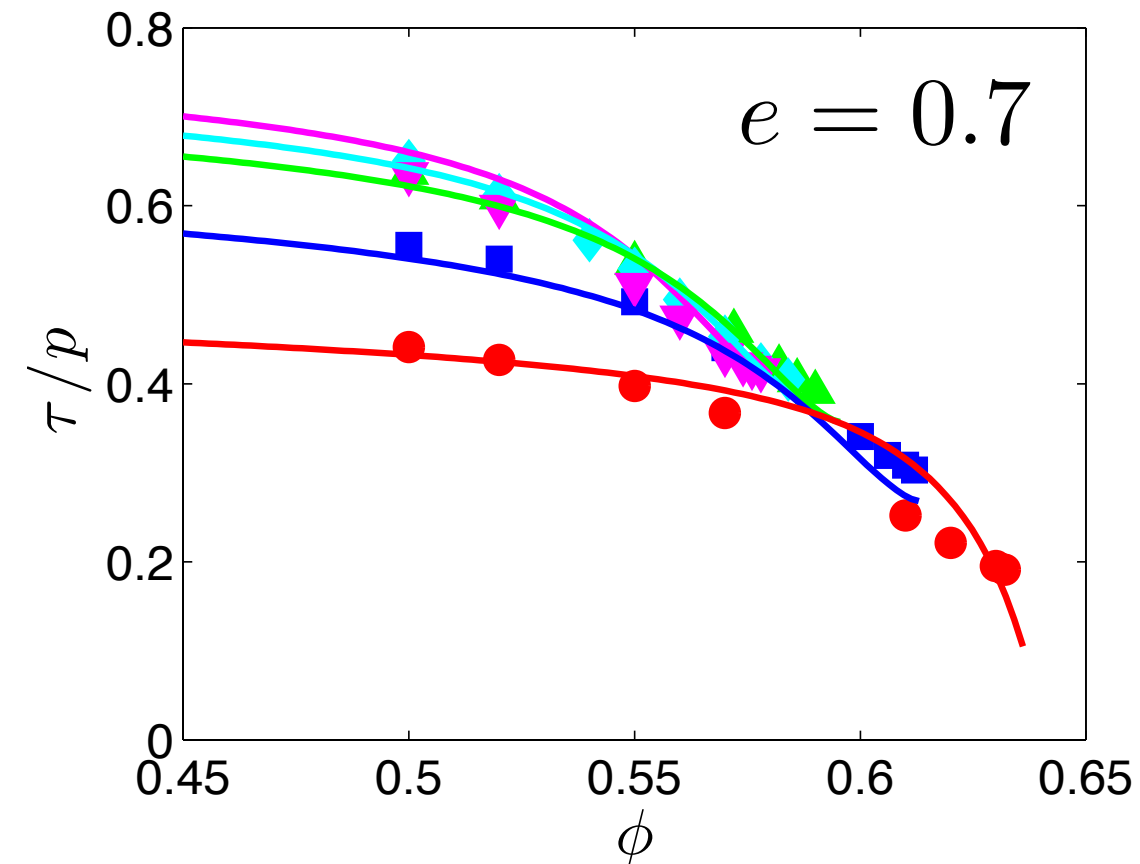
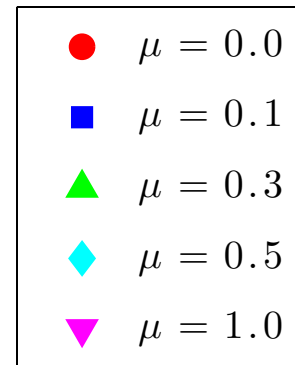


- Our proposed model:

$$p = \rho_s \phi [1 + 4\eta\phi g_0] T$$

$$\tau = \left(\frac{2J}{5\sqrt{\pi}} \right) \frac{pd\dot{\gamma}}{F\sqrt{T}} \delta_1$$

$$\Gamma = \frac{12}{\sqrt{\pi}} \frac{\rho\phi g_0}{d} (1 - e^2) T^{3/2} \delta_2$$



Steady-state:

$$\Gamma - \dot{\gamma}\tau = 0 \quad \Rightarrow \quad T = T \frac{\delta_1}{\delta_2} \quad \Rightarrow \quad \delta_1 = \delta_2 \equiv \delta$$

$$\eta = \eta(I) = \eta_s + \frac{\alpha_2}{\left(\frac{I_0}{I}\right)^{1.5} + 1} \quad \Rightarrow \quad \delta = \frac{\eta(I)}{\eta_{KT,SS}}$$

$$I \equiv \frac{\dot{\gamma}d}{\sqrt{p/\rho_s}}$$

Summary and future work



- Proposed modified KT expressions that improves temperature, pressure, and shear stress predictions for frictional particles and dense flows
- Will soon implement model into MFLX continuum solver for testing on process-scale flow problems
 - ▶ Inclined chutes with/without sidewalls
 - ▶ Hoppers and bins
 - ▶ Fluidized beds