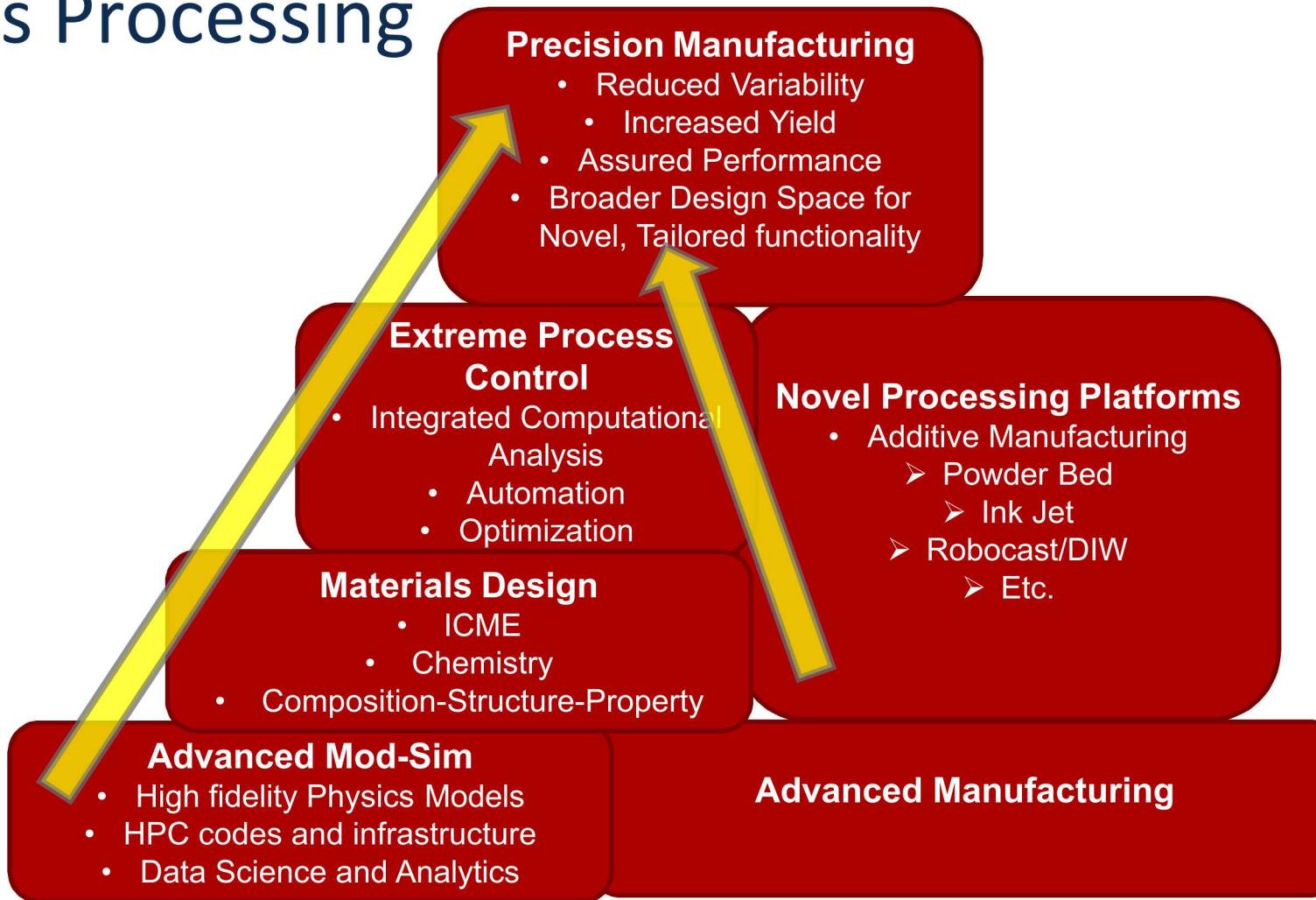


Particle-scale Modeling and Simulation of Powder Processing – Die Compaction

Jeremy B. Lechman, Chris Barr, Dan Bufford, Marcia Cooper,
Stewart Silling

MACH Conference
April 2019

Enabling Precision Manufacturing for High Consequence Small Lot Particulate Materials Processing



Particulate Materials and Processes in Manufacturing



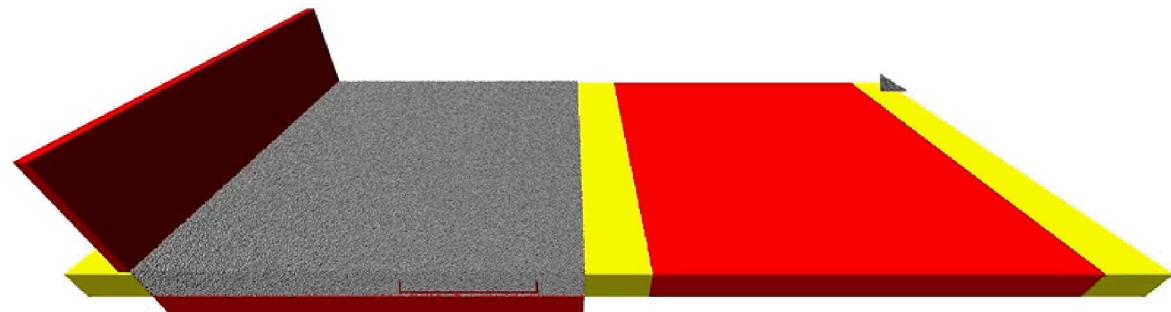
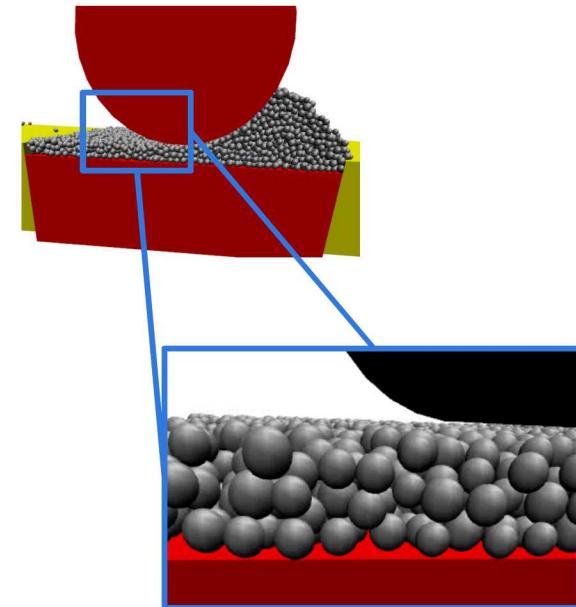
- Particulate Materials are ubiquitous
 - Complex and highly variable
 - Behavior hard to predict and control → processing is inefficient and energy intensive
 - Nonlinear, dissipative interactions
 - Many nonequilibrium, history dependent, metastable states
 - Manufacturing processes require careful validation (Quality by Design)
 - “Focusing exclusively on qualification efforts without also understanding the manufacturing process and associated variations may not lead to adequate assurance of quality.” – FDA guidance to pharma
- Particle dynamics modeling – Newton’s equations for each individual particle
 - Provides a framework for analyzing/optimizing process design, controls and validation
 - Links feedstock materials’ characteristics to processing conditions to resulting states/properties and performance attributes (FP³ provides the science basis for QbD)
- Traditional processes
 - Die-filling and compaction
 - Size reduction (crushing, grinding, milling, ...)
 - Mixing, blending
 - Extrusion
- AM Processes
 - Powder bed – SLM, SLS
 - Inkjet Binder
 - Robocasting/DIW, ...
- Small-lot, intrinsically variable → precision is key for assured performance

Modeling particle formation, storage/handling, transport, placement, and reuse at the particle scale is critical to understanding sources and consequences of variation on both the feedstock and process as well as their interplay

Particle Dynamics Simulation

Method of choice: Discrete Element Method (LAMMPS)

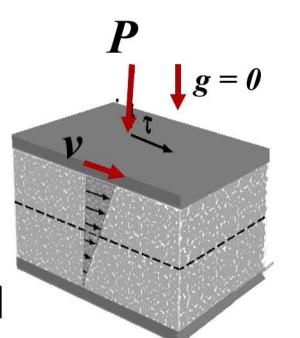
- Motion of individual particles numerically simulated
- Particle-Particle interactions: reduced-order contact mechanics models
 - Hertzian elastic and strain-hardening viscoplastic contact forces;
 - Coulomb friction, van der Waals attractions, adhesion
 - Implementing deformable particle capability
- Can account for
 - particle size (100:1), shape variations
 - complex geometries (e.g. moving spreader, partially manufactured part)
 - variations in particle material properties/surface characteristics
- Computationally detailed: leverages high-performance computing resources and next-gen platforms
- **Current challenge: model parameter estimation, calibration, validation and uncertainty quantification**



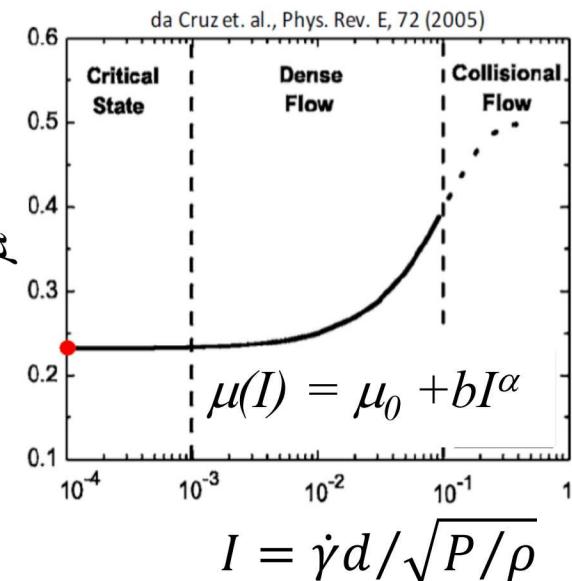
Computational Bulk Rheology

■ Rate controlled

- Flow is always enforced
- “mu-of-I” rheology proposed
 - Links quasi-static and inertial flow regimes
 - Behaves like a yield stress fluid

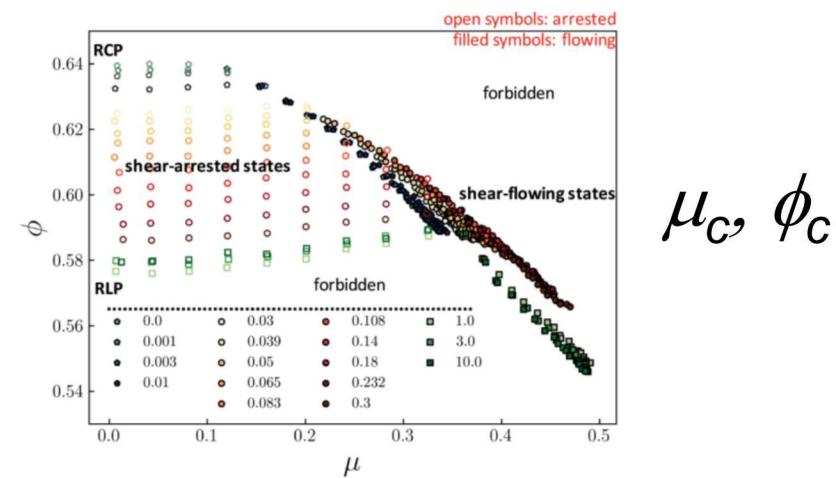
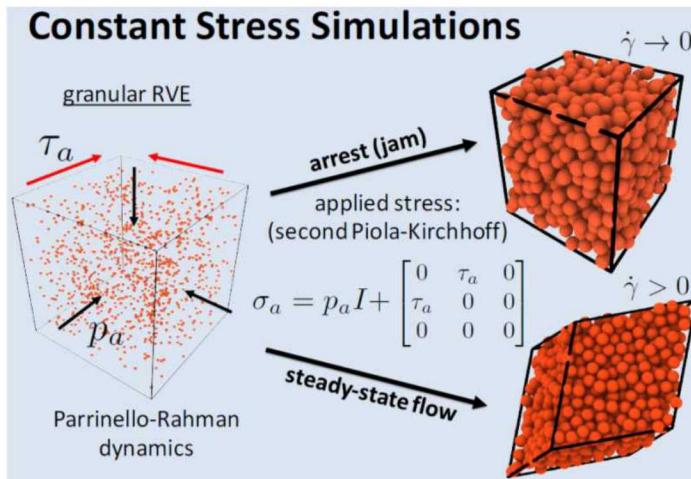


$$\mu = \tau/P$$

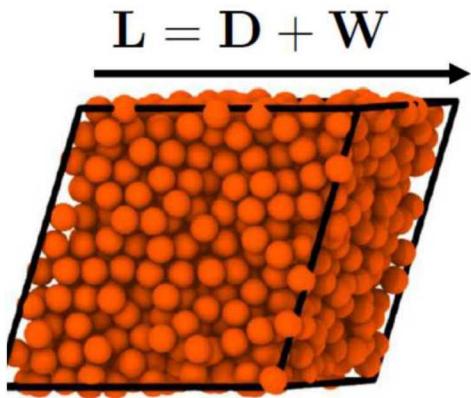


■ Stress controlled

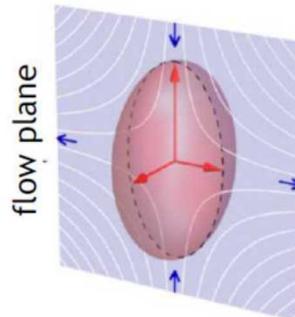
- May or may not flow...



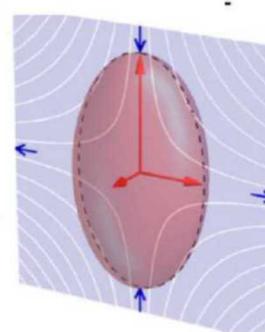
General Decomposition of Steady Shear Flow



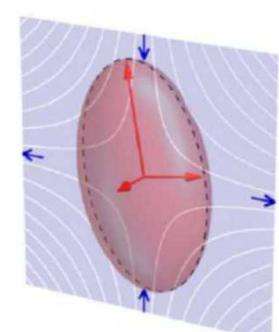
co-directional flow



co-axial flow



complex flow



$$\sigma_a = p_a I + \begin{bmatrix} 0 & \tau_a & 0 \\ \tau_a & 0 & 0 \\ 0 & 0 & 0 \end{bmatrix}$$

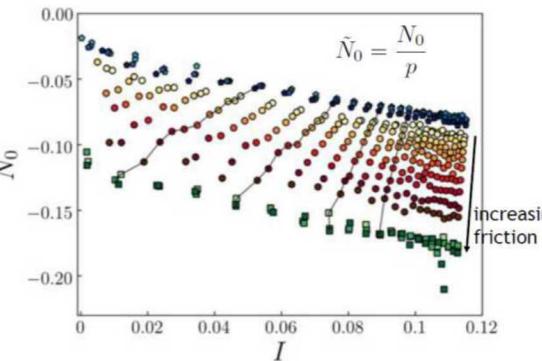
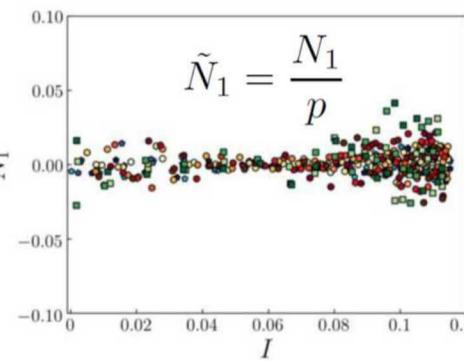
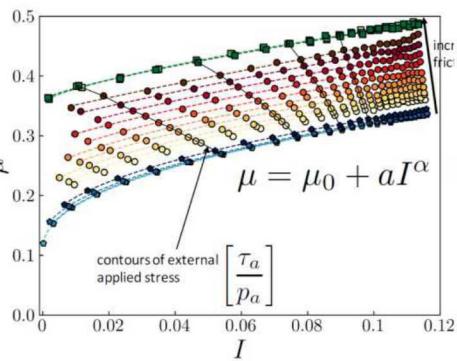
$$\frac{\sigma}{|\sigma|} = \frac{\mathbf{D}}{|\mathbf{D}|}$$

principal directions of stress and strain rate tensors coincide

principal directions of stress and strain rate tensors do not coincide

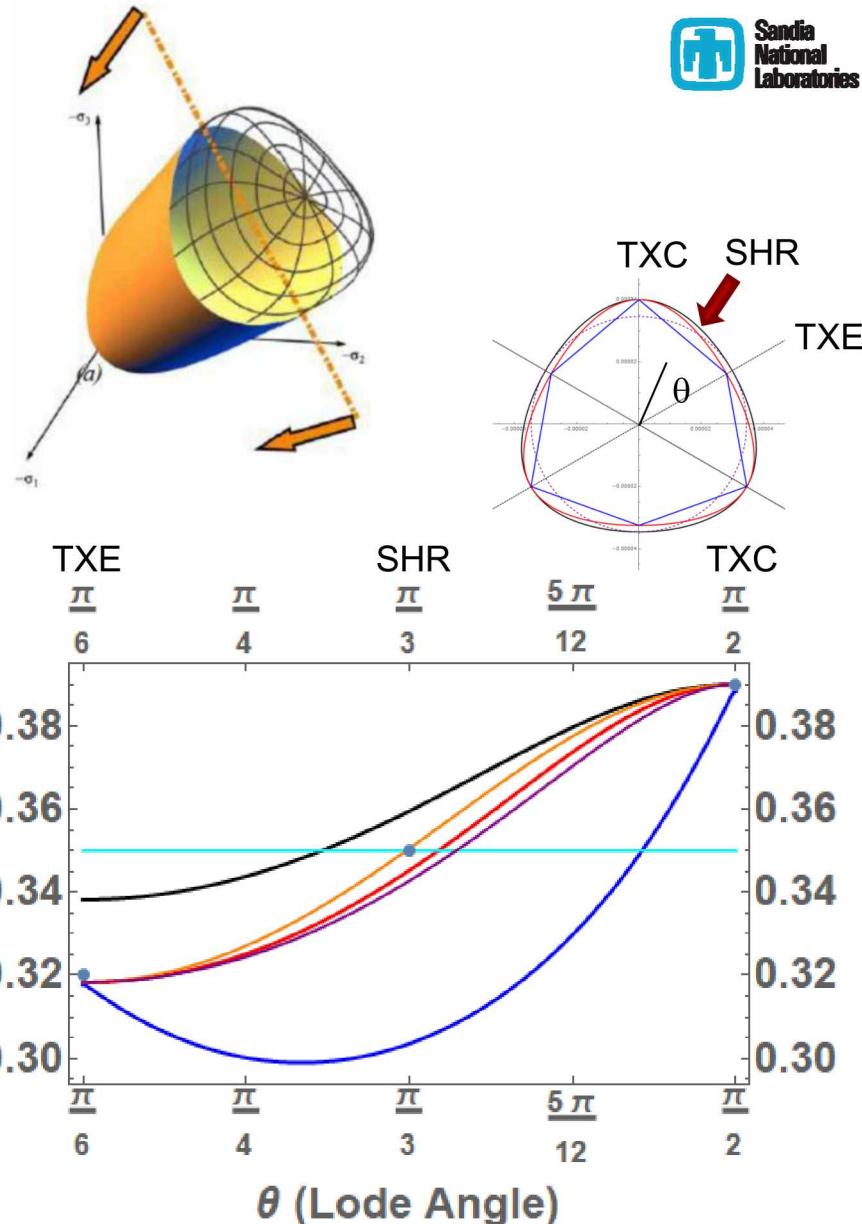
stress tensor in planar xy-shear

$$\sigma = \begin{pmatrix} p & \tau & 0 \\ \tau & p & 0 \\ 0 & 0 & p' \end{pmatrix} p' < p$$



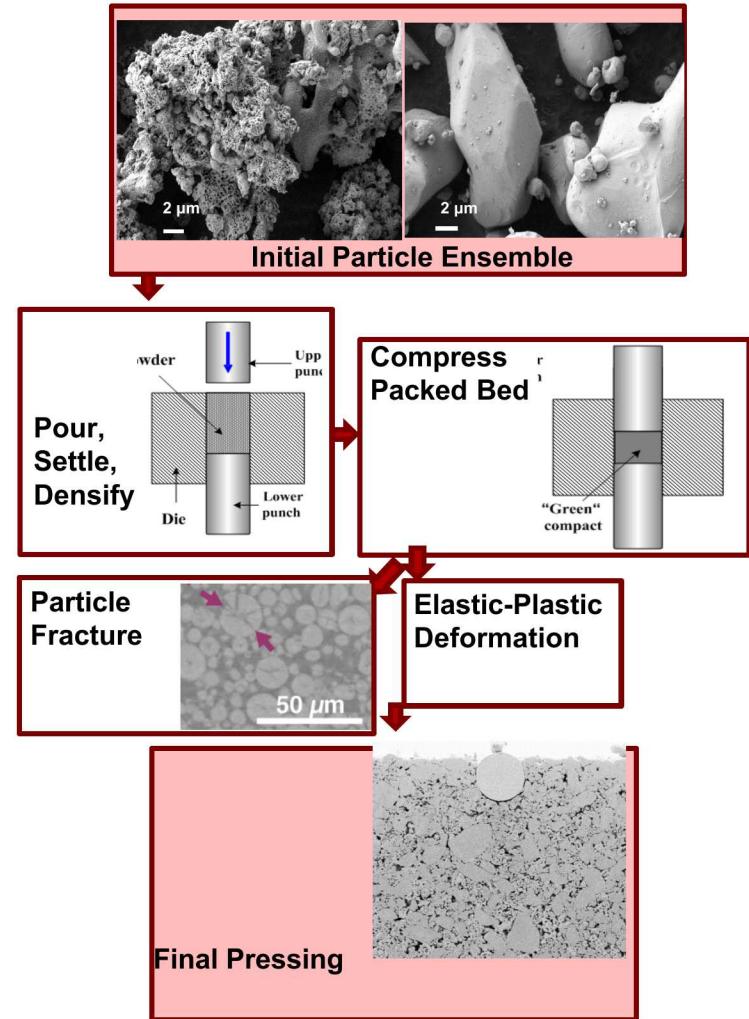
3D Stress Dependence of Flow (Arrest/Yield)

- Rheology will also depend on Lode angle
 - Black: Duncan-Lade
 - Orange: Gudehus
 - Red: Matsuoka-Nakai
 - Purple: William-Warnke
 - Blue: Mohr-Coulomb
 - Cyan: Drucker-Prager



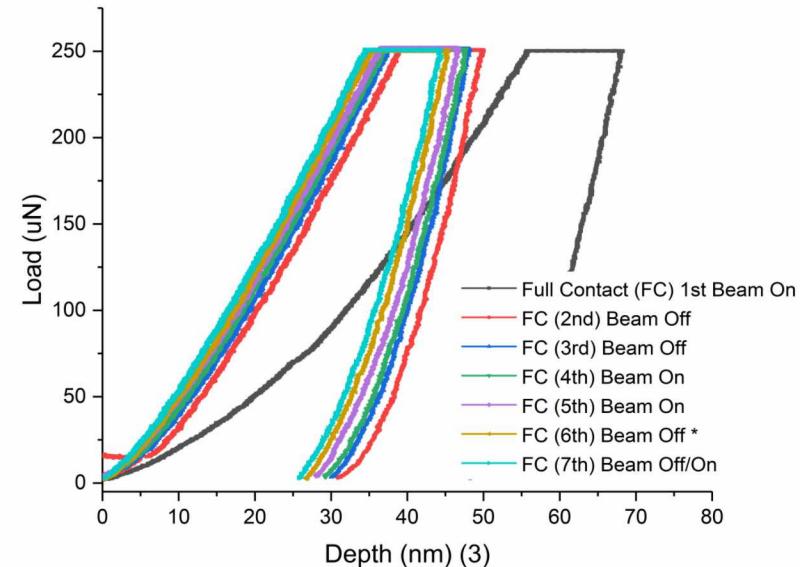
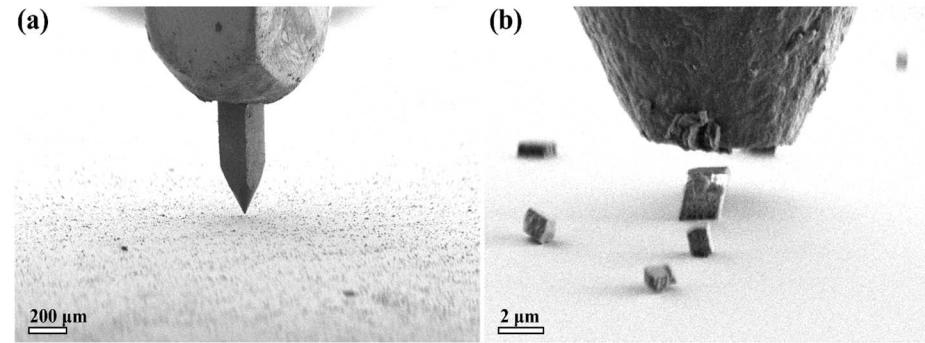
Traditional Process – Die Compaction

- Low porosity particle packings manufactured by simple die compaction
- Particle characteristics and manufacturing methods determine the morphology of the resulting packing
- The microstructure of low-porosity packings of energetic powders is influenced by particles' deformation, strength, and fracture behavior
 - Particles vary in size/shape distribution, material type (ductile, brittle, quasi-brittle) and surface characteristics
- Must discover complex-shaped energetic particle deformation and fracture
- Measure particle strength using nanoindentation with imaging at the microscale



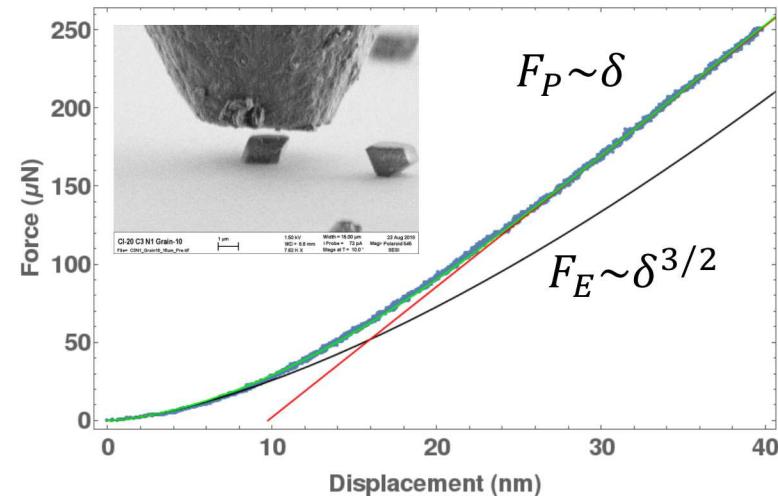
Micromechanics of Particles

- 1.6 micron (light scattering) CL-20 particles
- Nanoindenter with SEM imaging
- Electron beam effects were determined to be negligible
- Load – displacement curves were found to be very reproducible

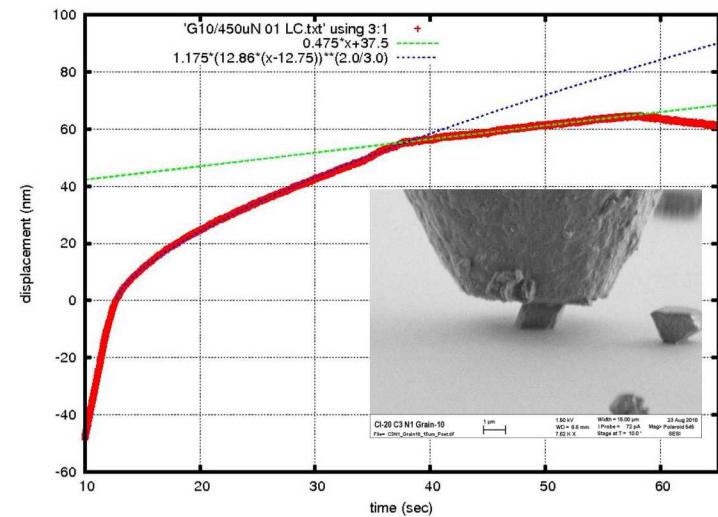


Force-Controlled Experiments

- Data is clean
- Clear linear elastic type response for early time in force ramp
 - Hertzian contact theory models this region well
 - Force vs. displacement
 - Displacement vs. time
- Later force-displacement data is linear
 - Could be indicative of yield?
- Force hold indicates plastic fluid-like flow consistent with yield noted previously
 - Force constant while displacement increases linearly in time
 - No clear bound seen – rate of increase small and hold time was short
- Model for loading response: Brake (2015)
Int. J. Solid. Struct., 62, 104-123

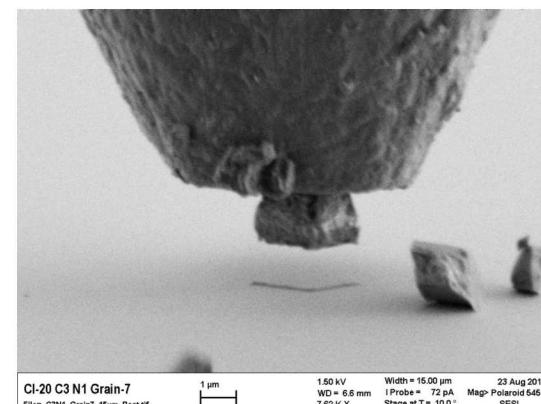
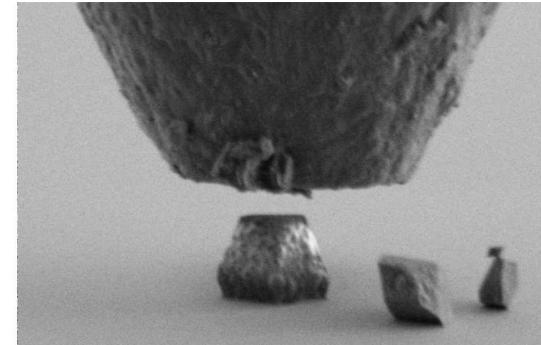
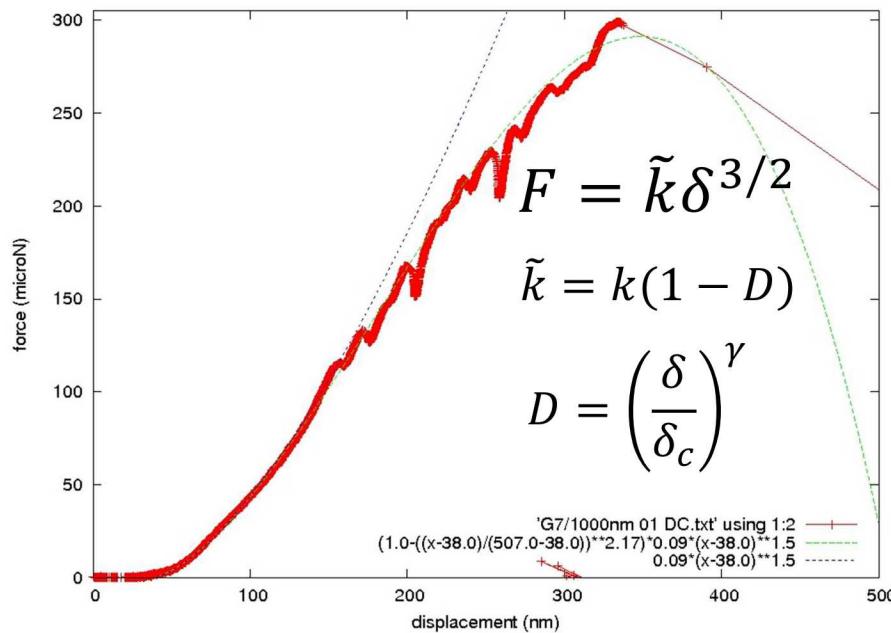


$$F_{tot}(\delta) = \varphi_1(\delta)F_E(\delta) + \varphi_2(\delta)F_P(\delta)$$



Displacement-Controlled Experiments

- Quasi-brittle behavior with damage accumulation
- Complicated load displacement response...



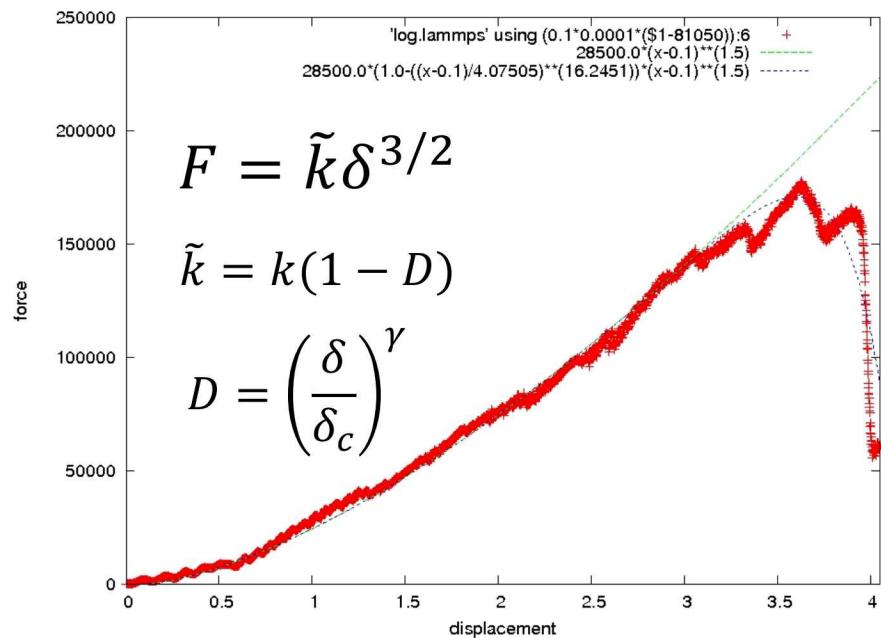
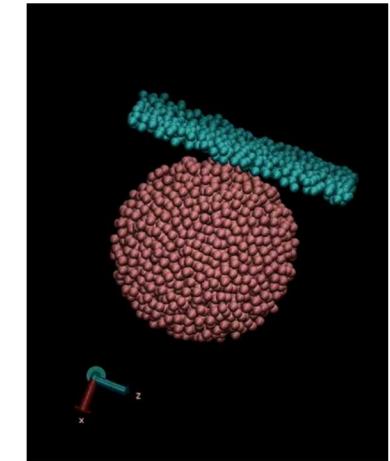
Deformable Particles via beam-bonded DEM

- Construct large particle from many smaller particles bonded by beam-like springs

Bonded-DEM model based on Carmona et al. (2008) Phys Rev E, 77, 051302-1-10

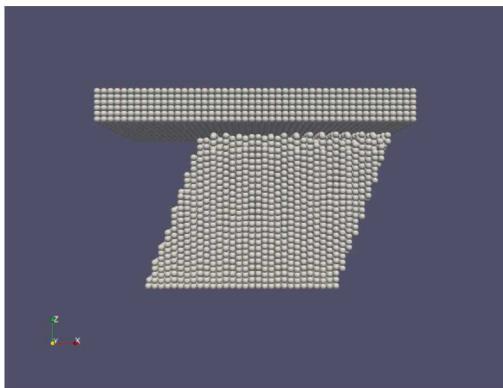
- Force response consistent with LE mechanics with damage – continuum damage mechanics type phenomenology

L.M. Tavares, R.P. King, Powder Technology 123(2) (2002) 138-146

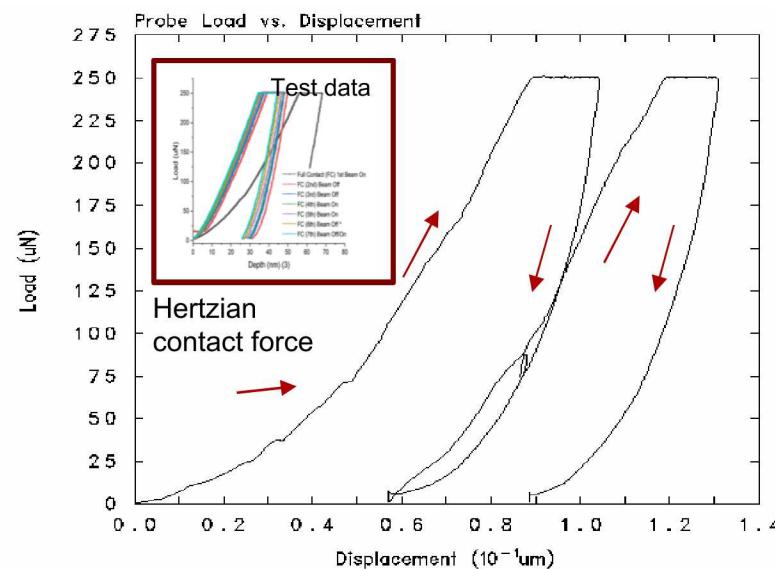
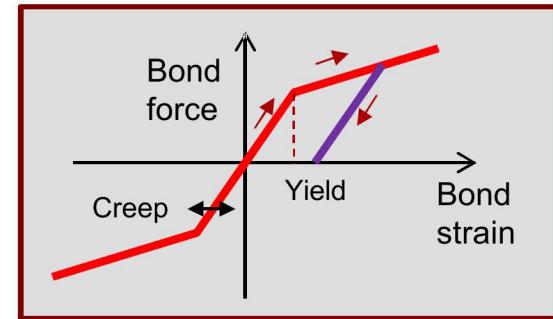


Peridynamic material model for particle mechanics

- Key features: Includes permanent deformation from
 - Plasticity (instantaneous)
 - Creep (time dependent)



Two loading cycles in an irregularly shaped crystal

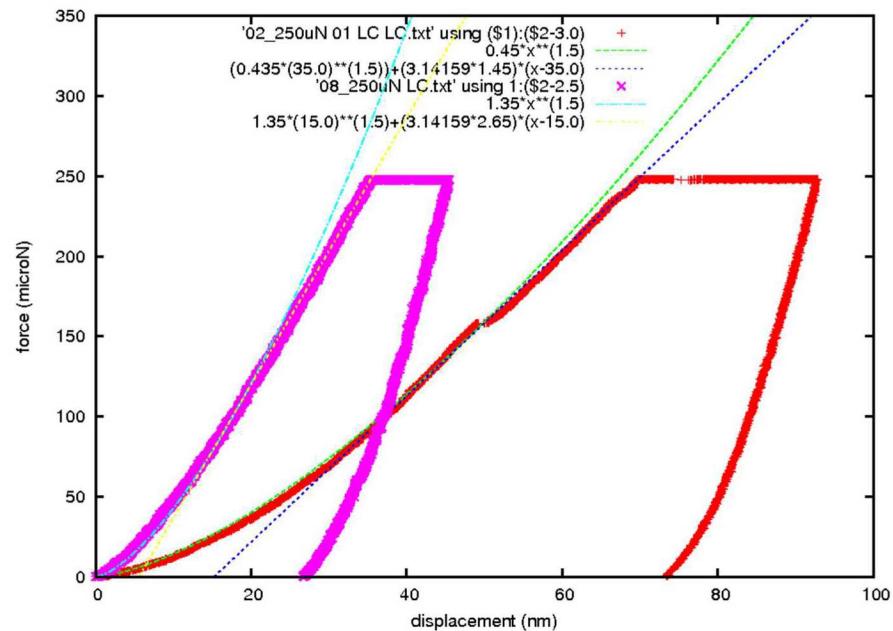
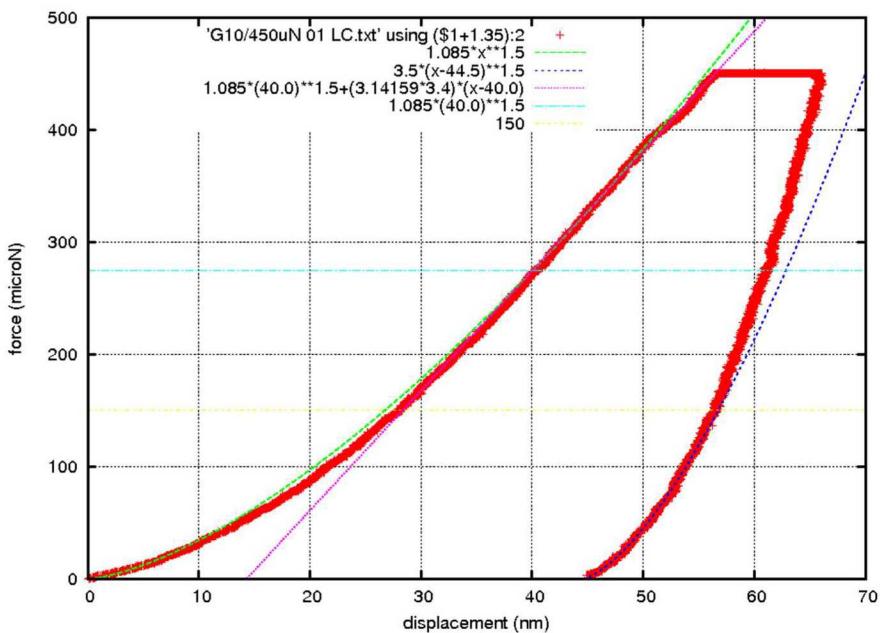


Conclusions and Outlook

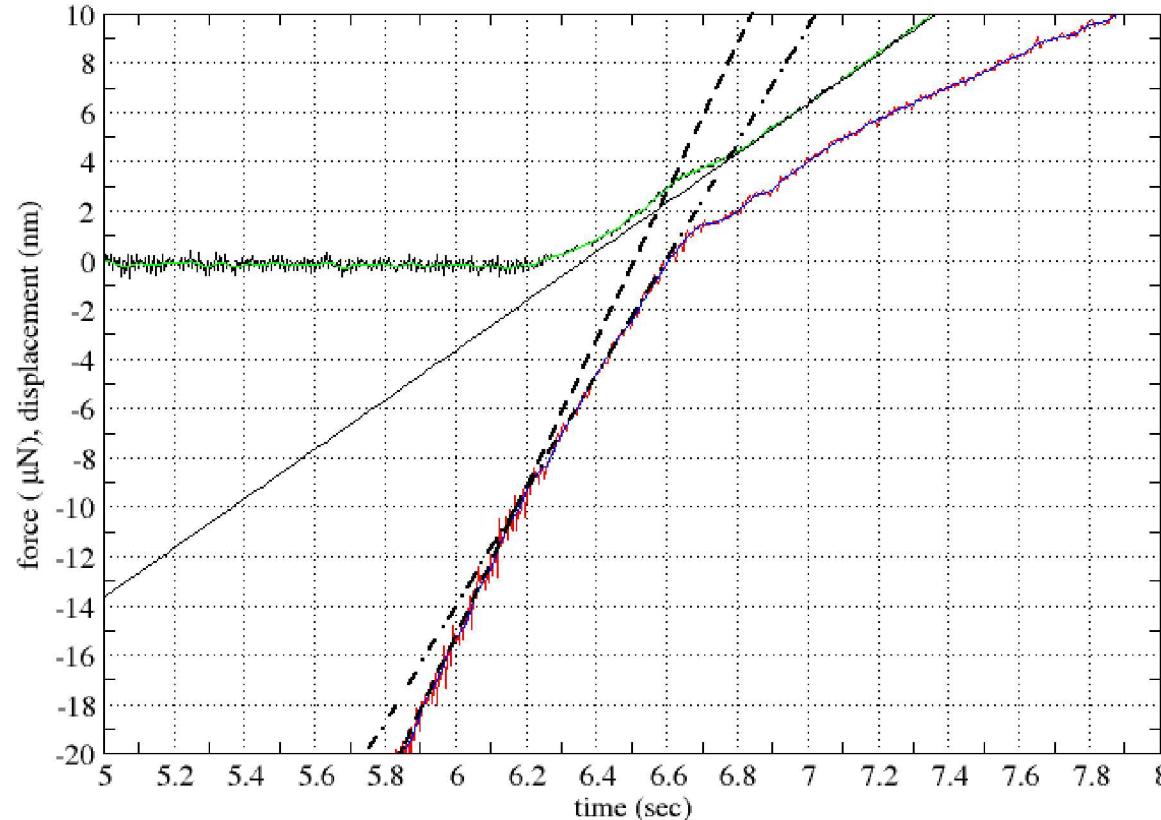
- DEM becoming predictive for powder rheology under low pressures
- Many applications involve high pressure – die compaction
- Micromechanics of particles can be characterized
- Phenomenology of particle micromechanics can be captured in reduced-order and robust particle-type models
- Ongoing work is focused on coupling these methods in HPC code

Thank you.

Comparison to Thornton Elastic-plastic Contact Model

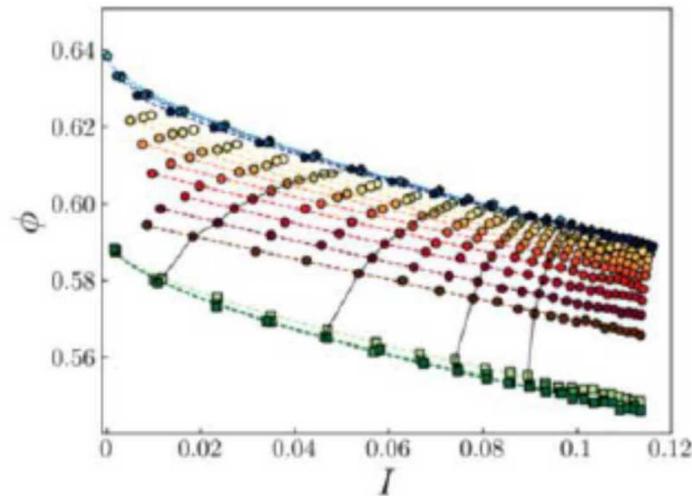
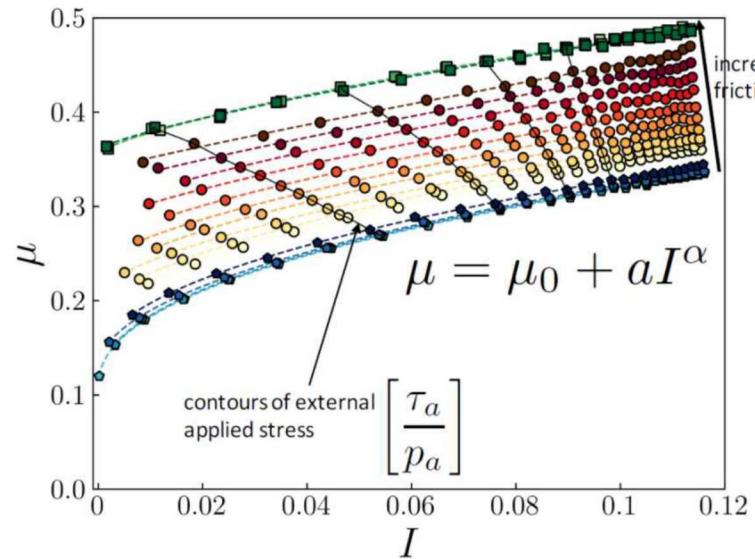


Early time details – where's the zero?



How Does Powder Flow?

- Apply stress state consistent with viscometric flow
- Decompose macroscopic/bulk flow
 - Homogeneous
 - Planar \rightarrow viscometric
- For incompressible simple fluid, three viscometric functions necessary for full rheological description
 - Shear viscosity
 - Two normal stress differences



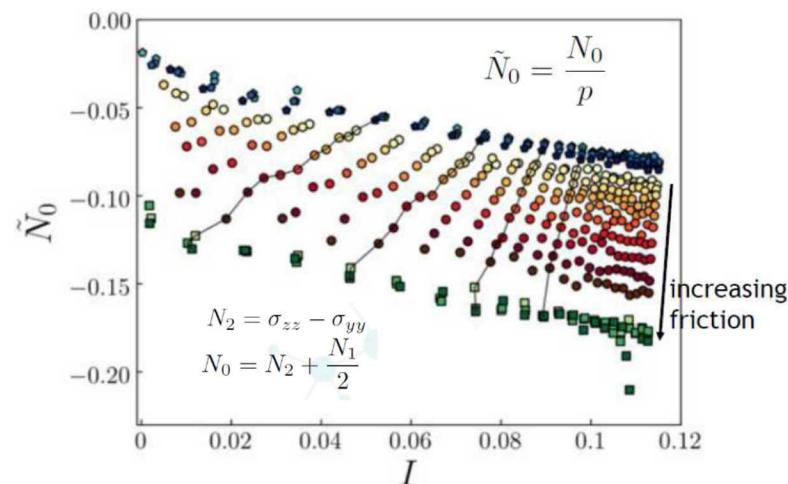
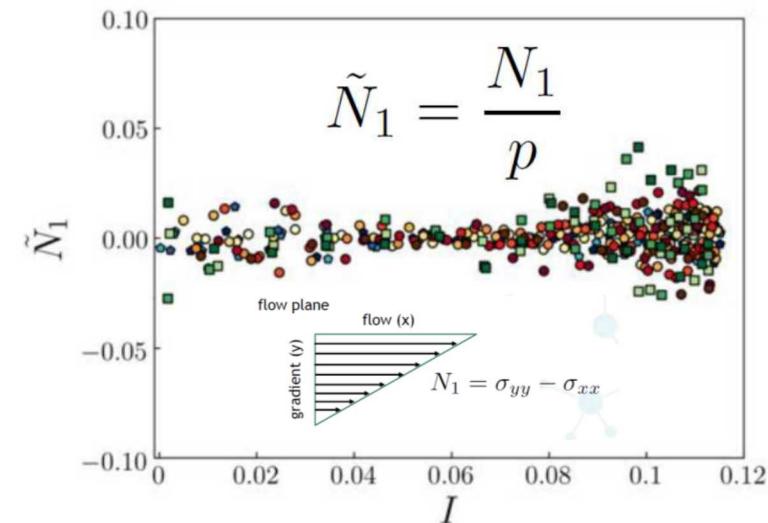
Normal Stresses in Steady Granular Flows

- Steady-state flows of isotropic granular particles are
 - Not complex
 - Stress and strain-rate tensors are aligned
 - Not co-directional
 - Magnitudes of stress and strain-rate in principle directions are different
 - Coaxial

stress tensor in planar xy -shear

$$\sigma = \begin{pmatrix} p & \tau & 0 \\ \tau & p & 0 \\ 0 & 0 & p' \end{pmatrix} p' < p$$

flow functions in dense granular flows

$$\mu(I) \quad \phi(I) \quad \tilde{N}_0(I)$$


Statistical Analysis and Optimization for Control of Heterogeneous Materials

Property Prediction/Performance Targeting In Heterogeneous Materials

