

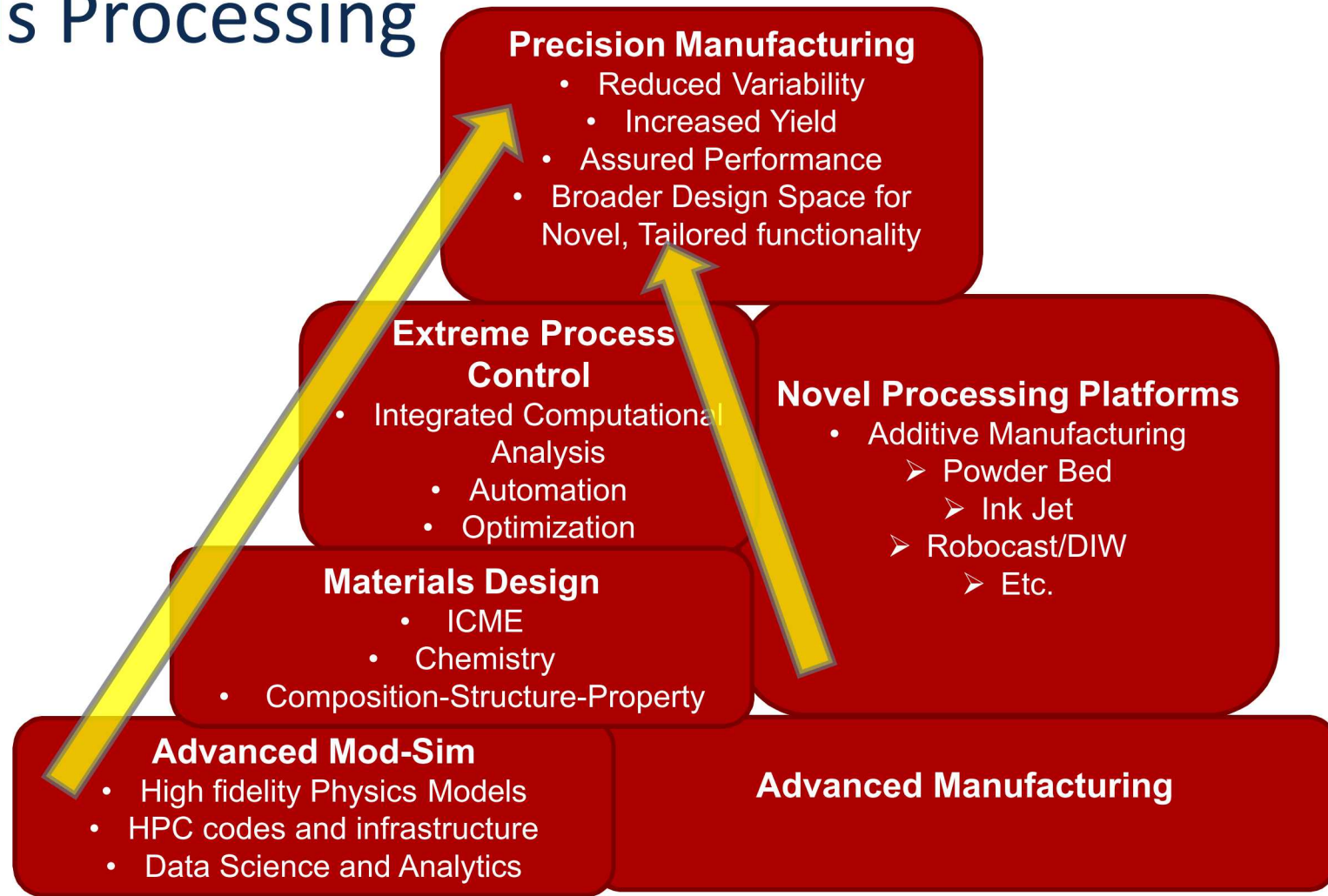
Particle-scale Modeling and Simulation of Powder Processing – Die Compaction

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Enabling Precision Manufacturing for High Consequence Small Lot Particulate Materials Processing



Particulate Materials and Processes in Manufacturing



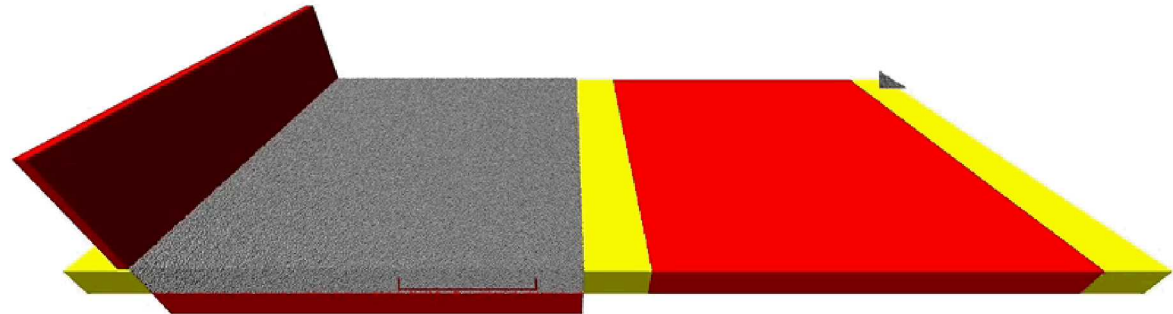
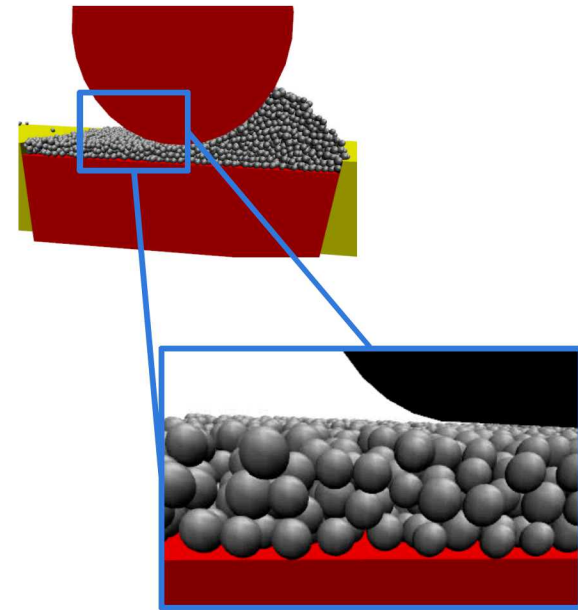
- Particulate Materials are ubiquitous
 - Complex and highly variable
 - Behavior hard to predict and control → processing is inefficient and energy intensive
 - Nonlinear, dissipative interactions
 - Many nonequilibrium, history dependent, metastable states
 - Manufacturing processes require careful 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)

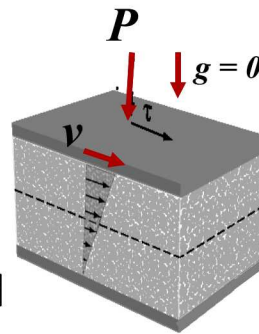
- Motion of individual particles numerically simulated
- Particle-Particle interactions: reduced-order contact mechanics models
 - Hertzian elastic and strain-hardening viscoplastic contact forces;
 - Coulomb friction, van der Waals attractions, adhesion
 - Implementing deformable particle capability
- 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**



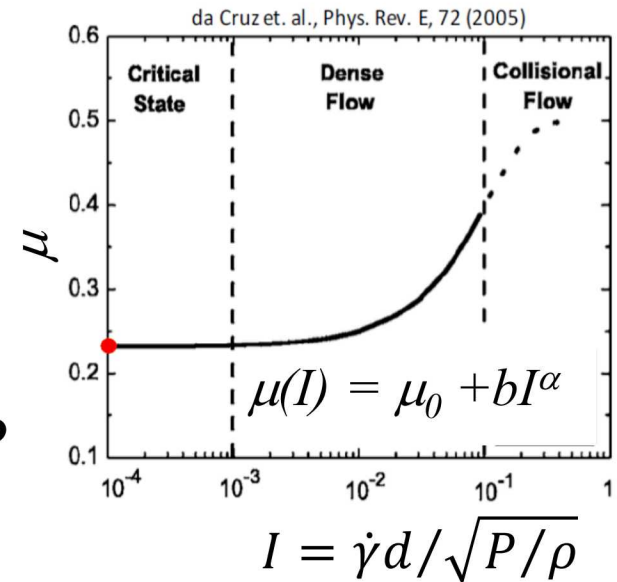
Computational Bulk Rheology

■ Rate controlled

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

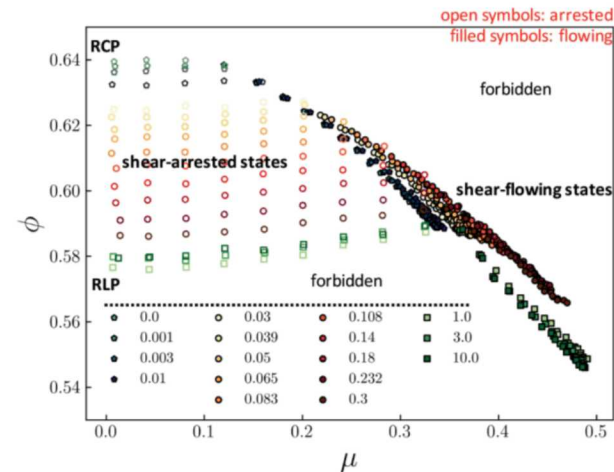
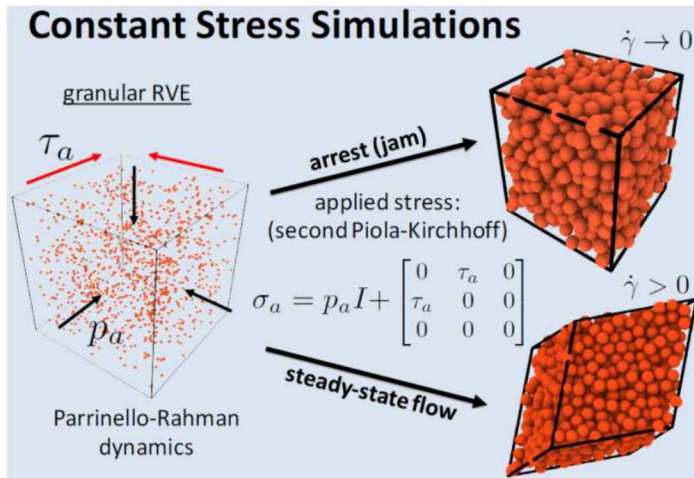


$$\mu = \tau/P$$



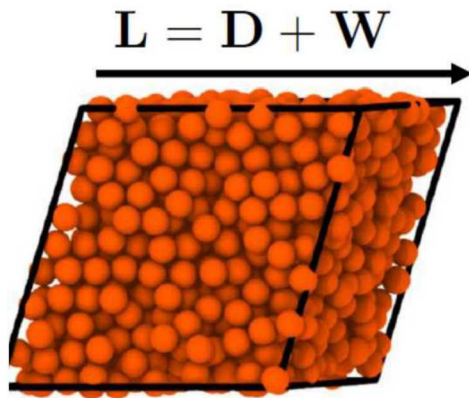
■ Stress controlled

- May or may not flow...

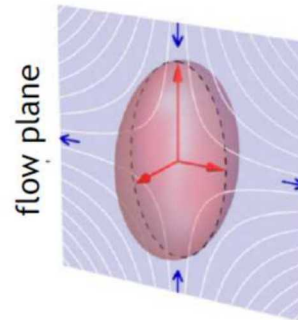


$$\mu_c, \phi_c$$

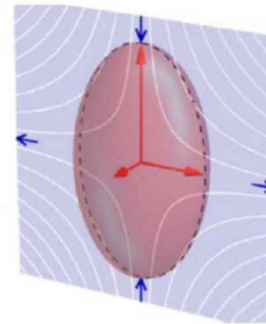
General Decomposition of Steady Shear Flow



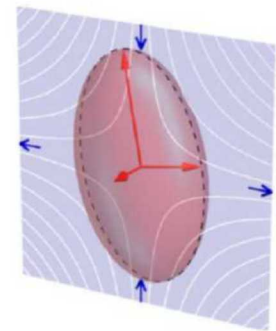
co-directional flow



co-axial flow



complex flow



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

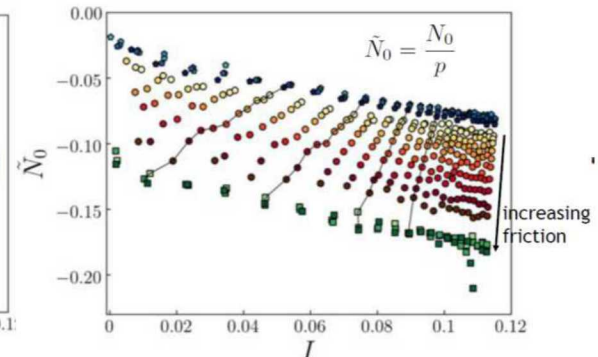
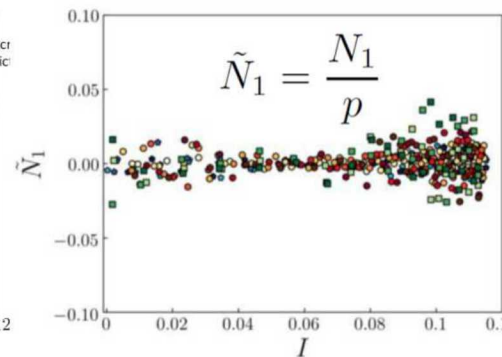
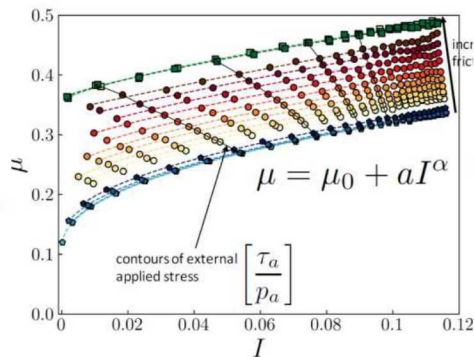
$$\frac{\sigma}{|\sigma|} = \frac{D}{|D|}$$

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

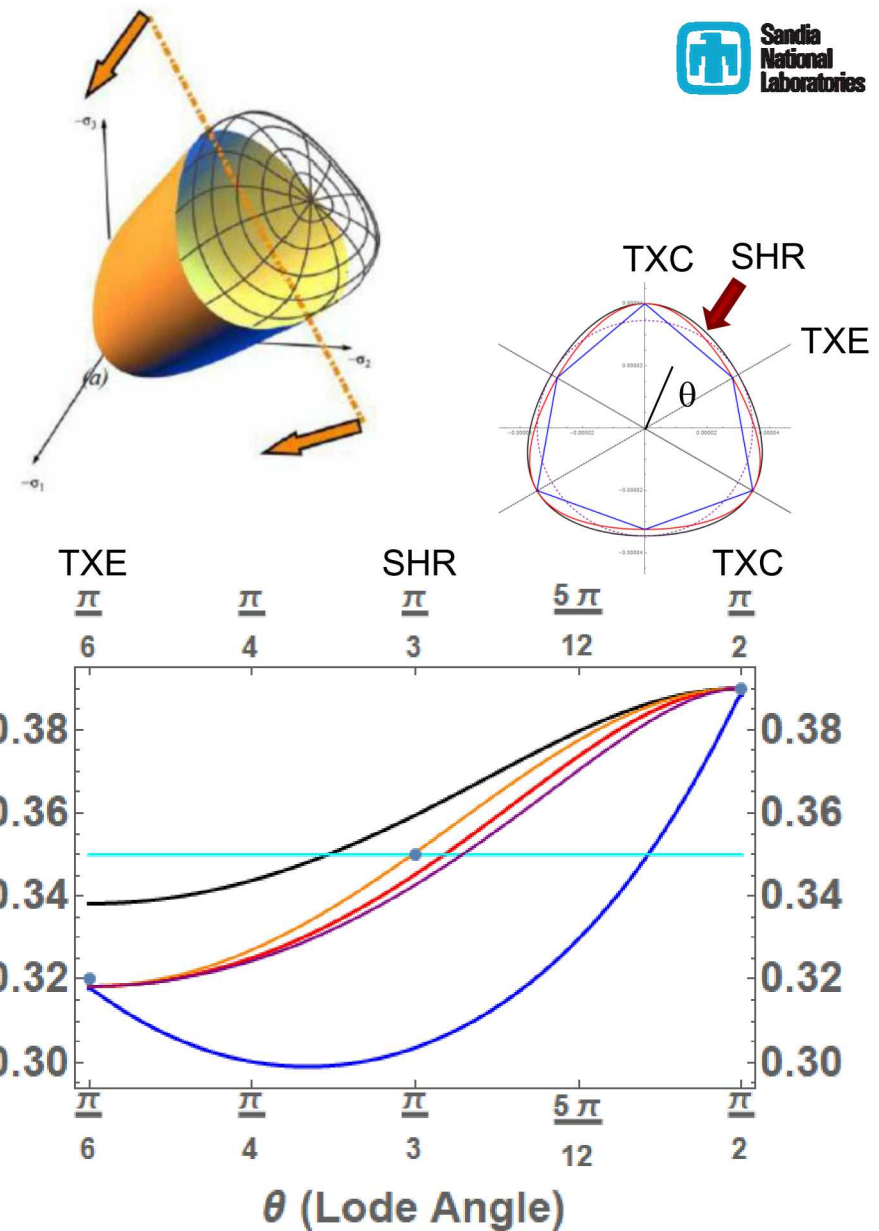
$$\sigma = \begin{pmatrix} p & \tau & 0 \\ \tau & p & 0 \\ 0 & 0 & p' \end{pmatrix} p' < p$$



3D Stress Dependence of Flow (Arrest/Yield)

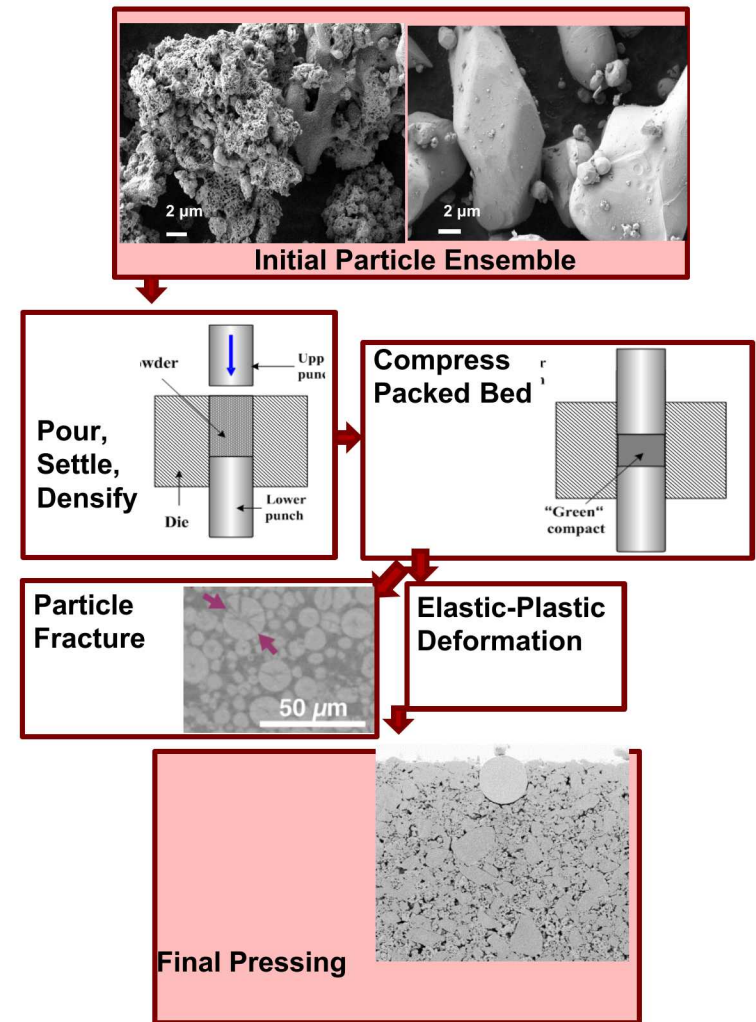
- Rheology will also depend on Lode angle
 - Black: Duncan-Lade
 - Orange: Gudehus
 - Red: Matsuoka-Nakai
 - Purple: William-Warnke
 - Blue: Mohr-Coulomb
 - Cyan: Drucker-Prager

$$a_{\sigma} = \mu(\theta) = \frac{\sqrt{J_2(\theta)}}{p}$$



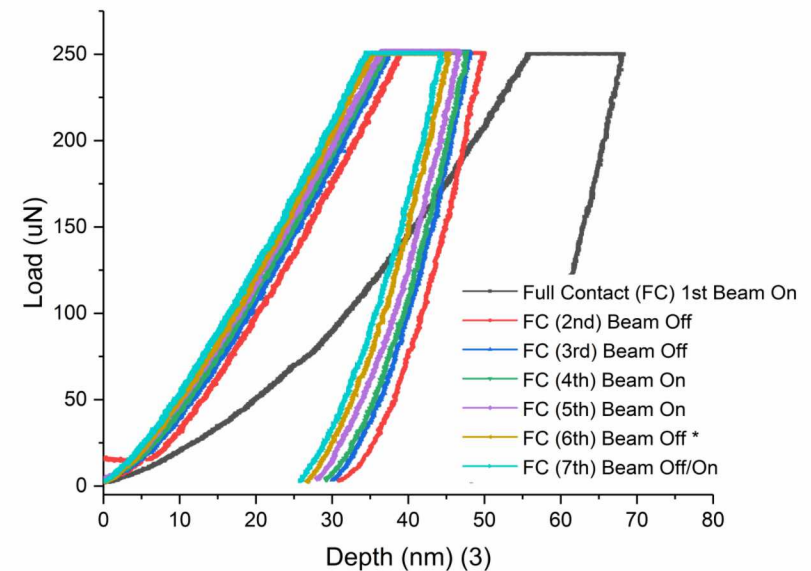
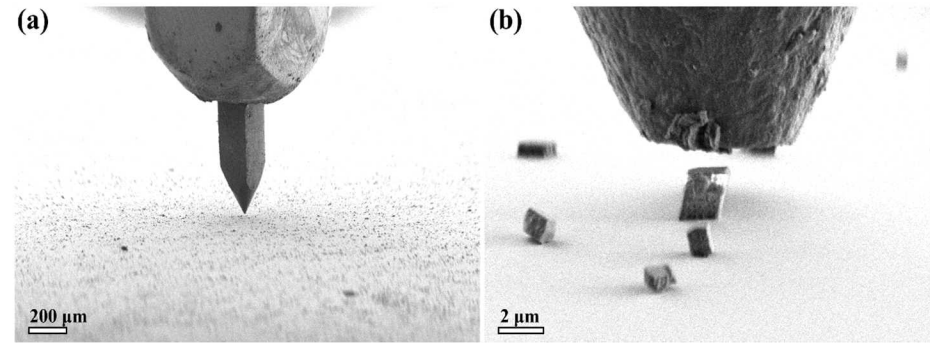
Traditional Process – Die Compaction

- 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



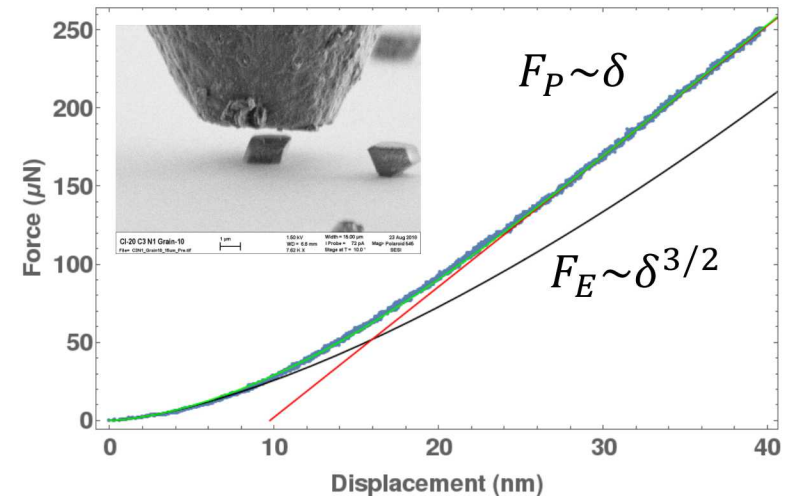
Micromechanics of Particles

- 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

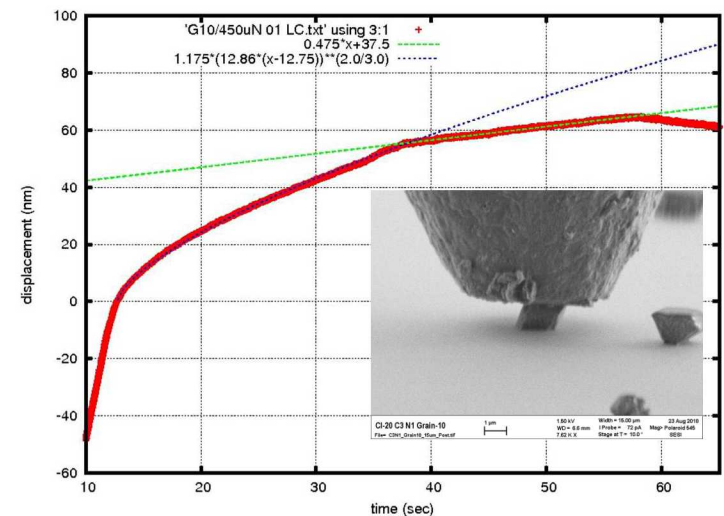


Force-Controlled Experiments

- 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

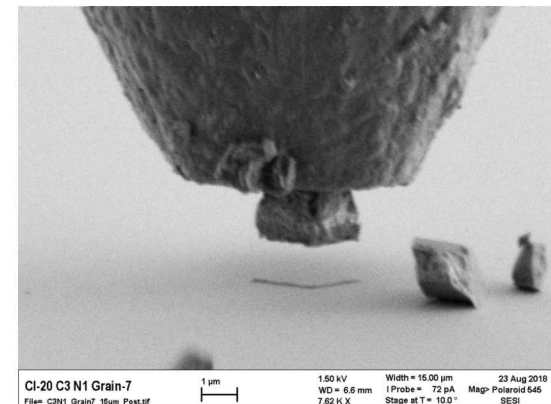
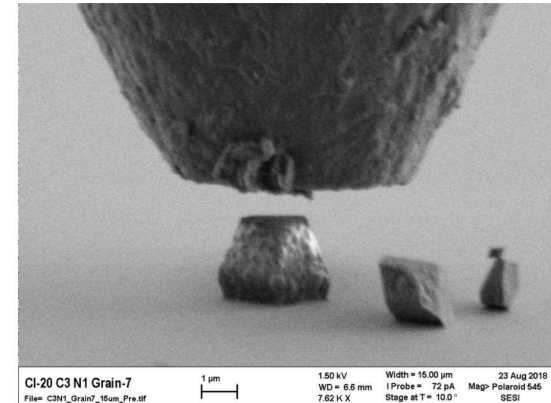
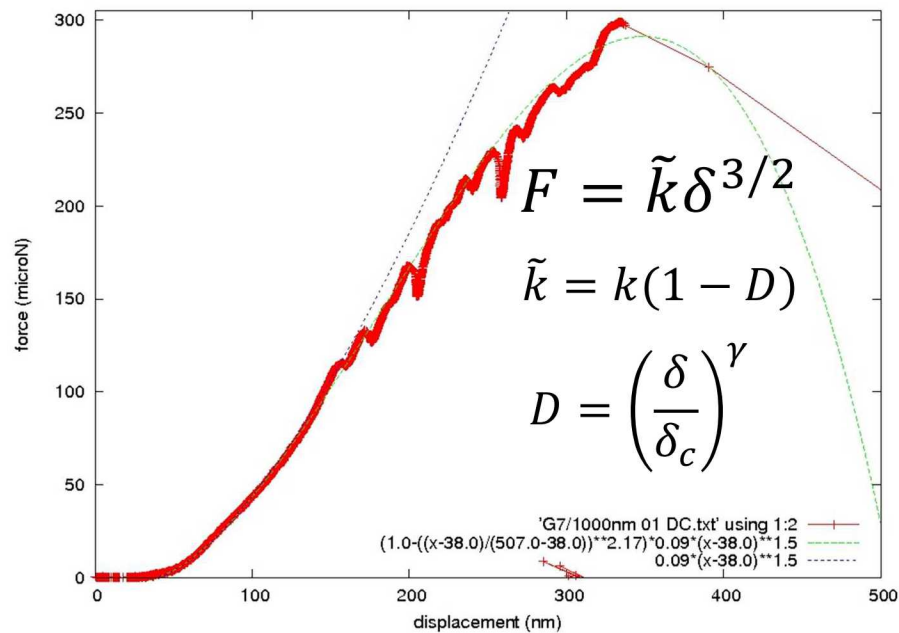


$$F_{tot}(\delta) = \varphi_1(\delta)F_E(\delta) + \varphi_2(\delta)F_P(\delta)$$



Displacement-Controlled Experiments

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



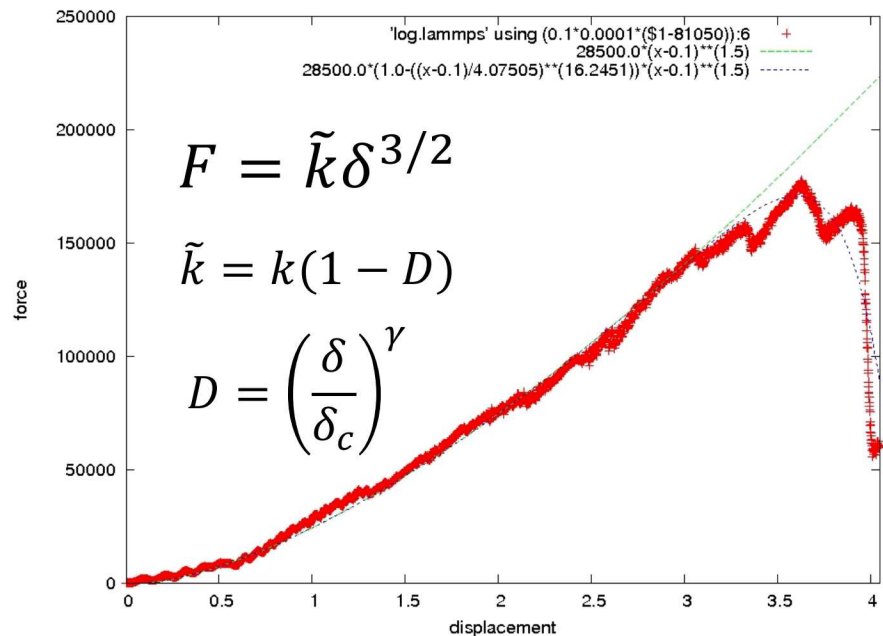
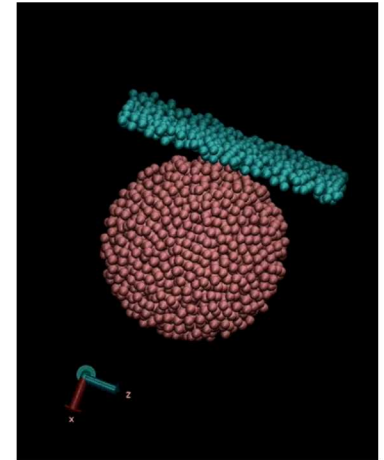
Deformable Particles via beam-bonded DEM

- 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

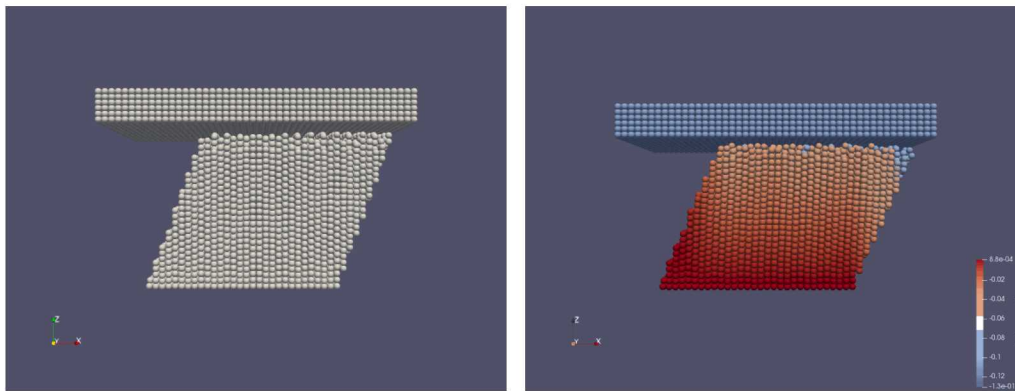
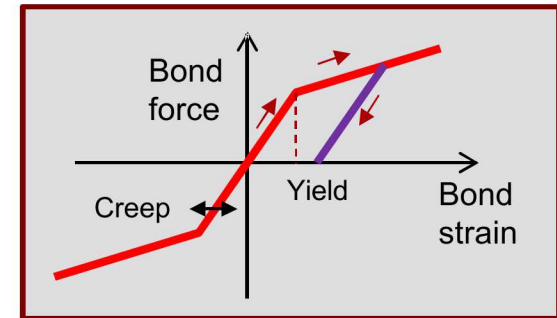
- Force response consistent with LE mechanics with damage – continuum damage mechanics type phenomenology

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

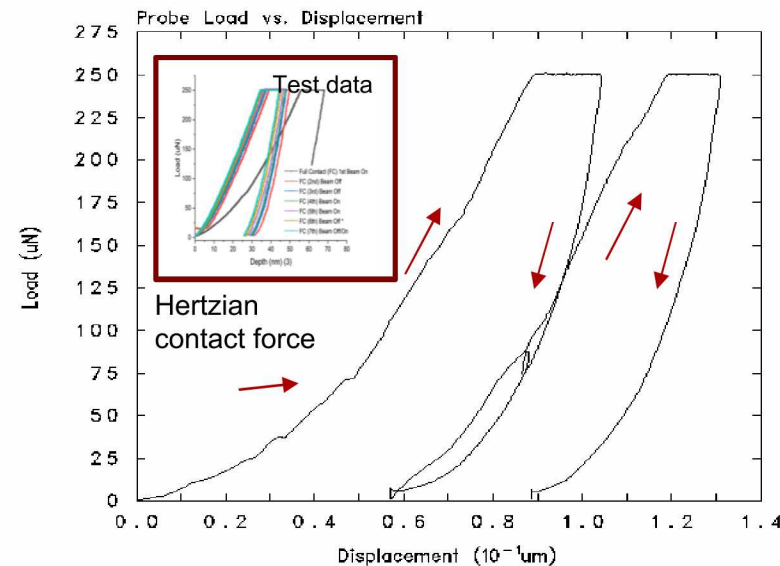


Peridynamic material model for particle mechanics

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



Two loading cycles in an irregularly shaped crystal

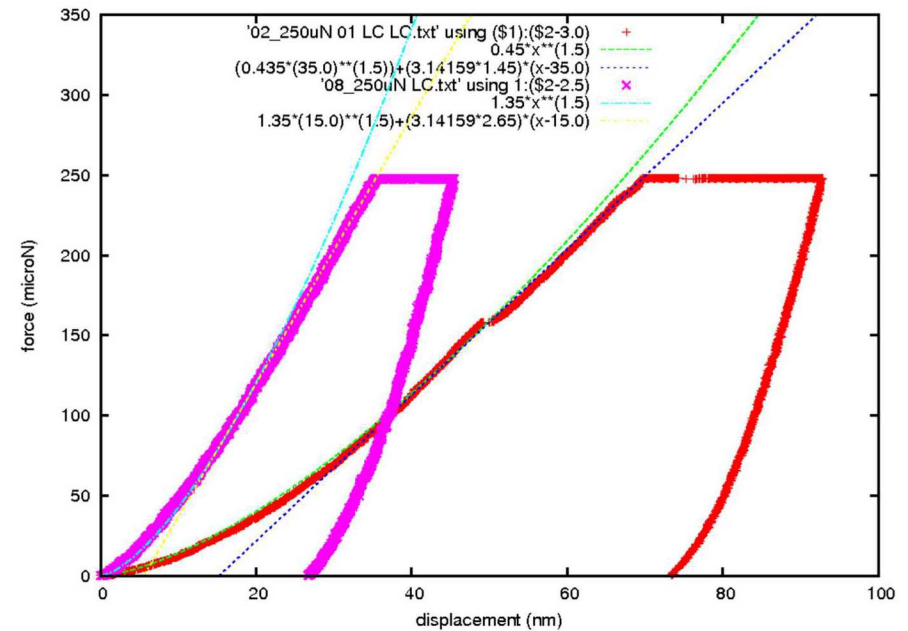
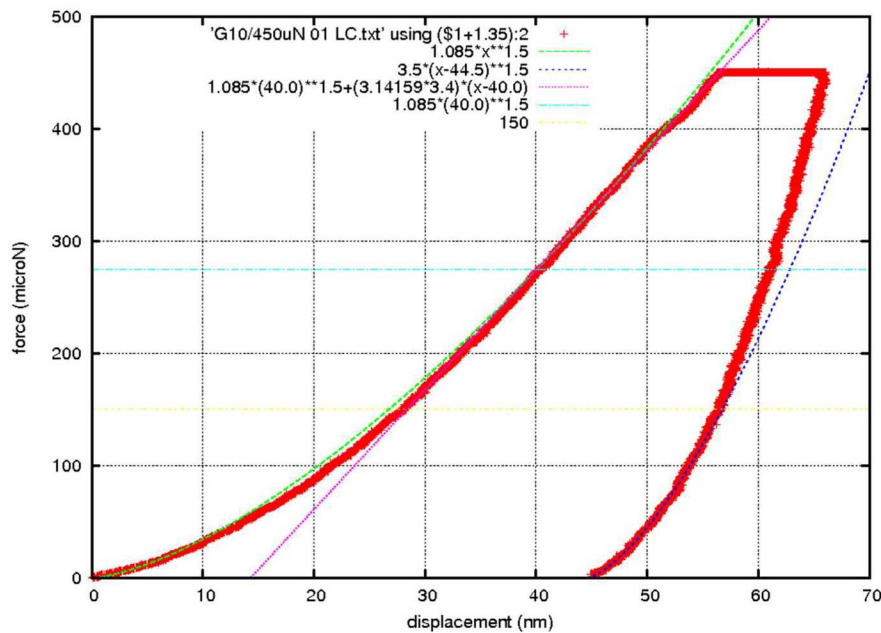


Conclusions and Outlook

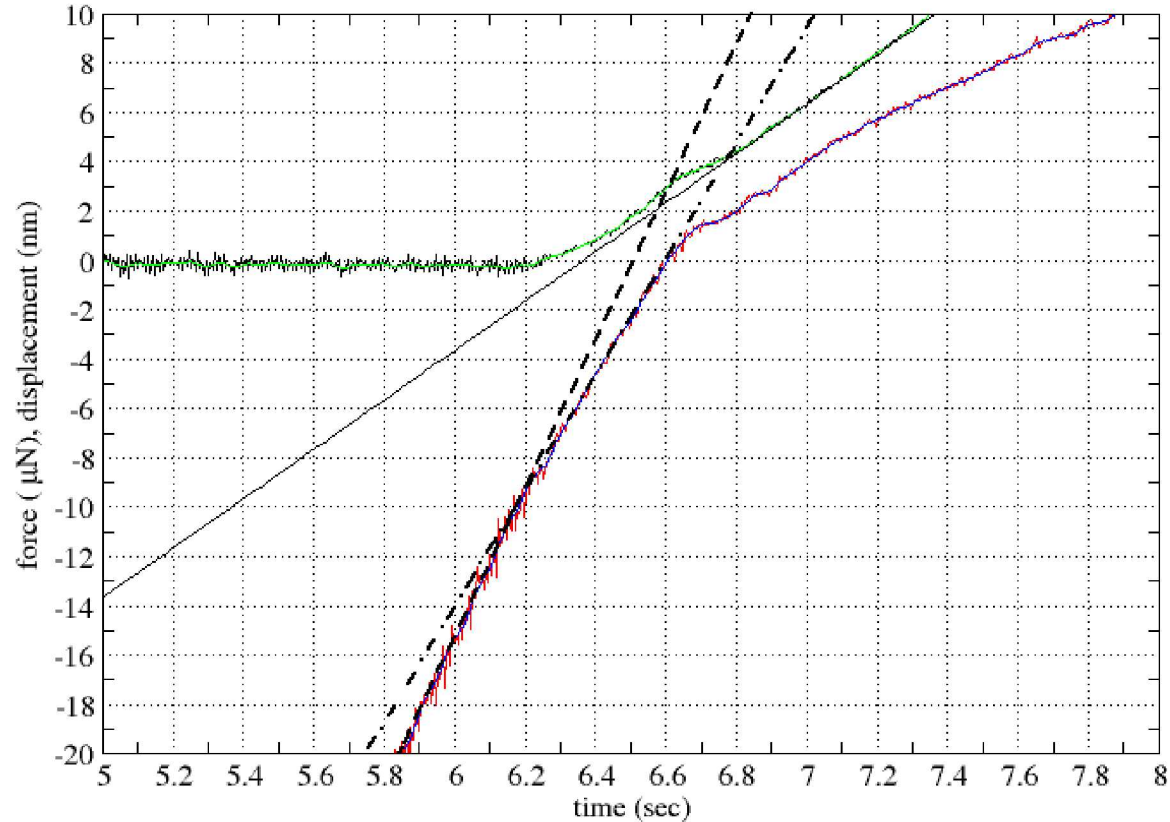
- DEM becoming predictive for powder rheology under low pressures
- Many applications involve high pressure – die compaction
- Micromechanics of particles can be characterized
- Phenomenology of particle micromechanics can be captured in reduced-order and robust particle-type models
- Ongoing work is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

Thank you.

Comparison to Thornton Elastic-plastic Contact Model

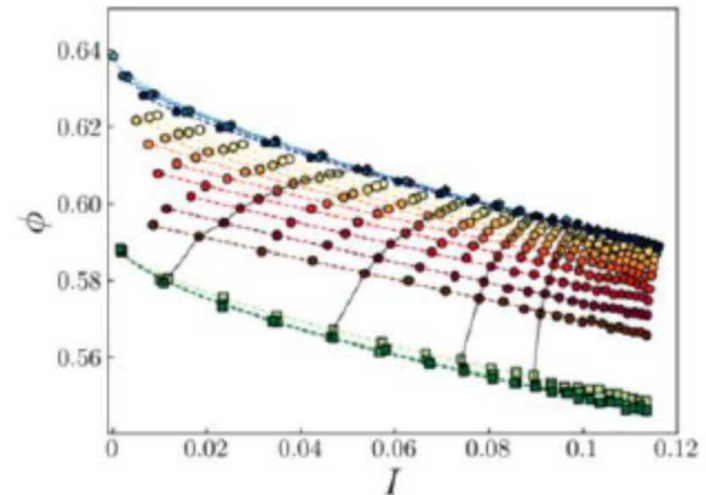
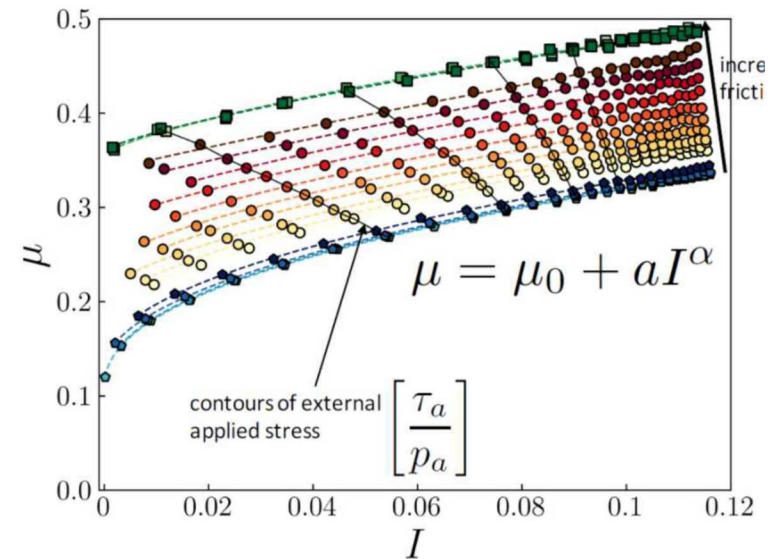


Early time details – where's the zero



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



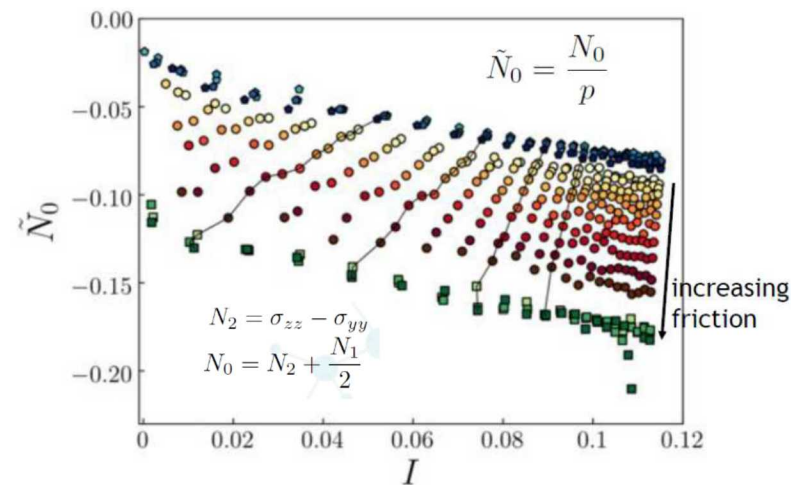
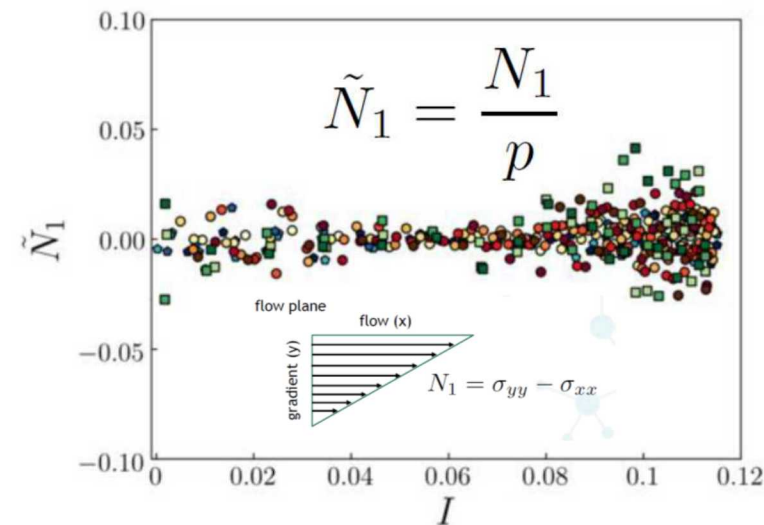
Normal Stresses in Steady Granular Flows

- 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

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

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**

