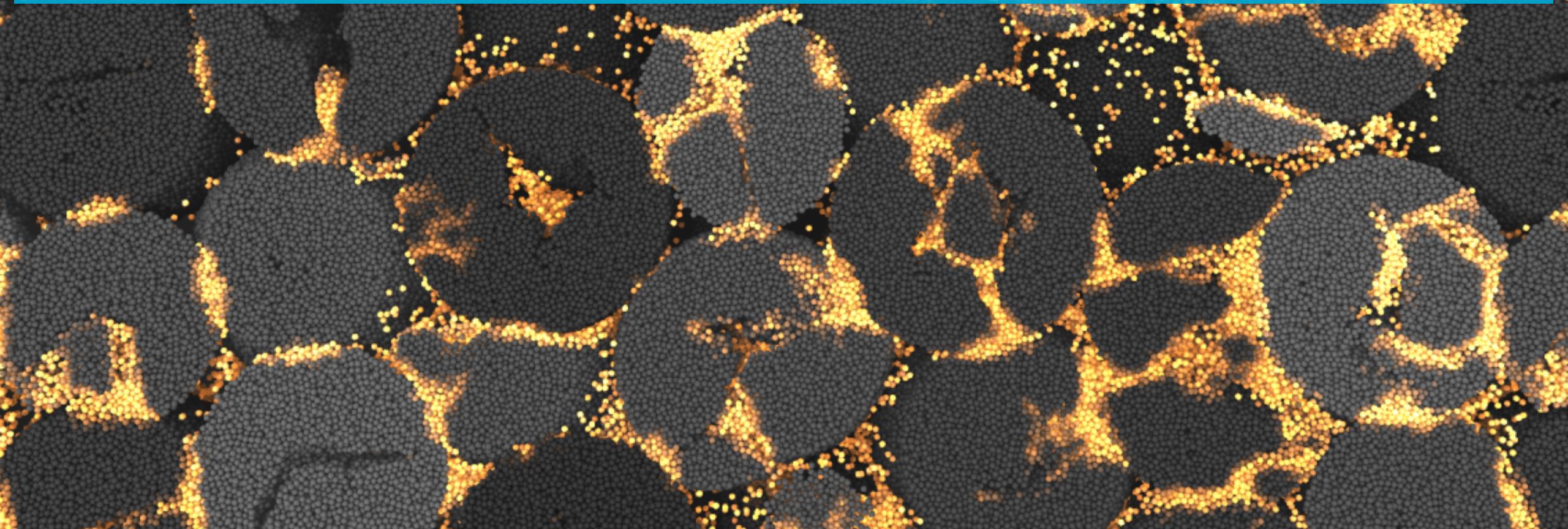


# Applications of large-scale discrete element models in deformation and fracture of brittle solid and particulate systems

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# Fragmentation of Brittle Material



Loading brittle solids and particulates activates many complex processes including:

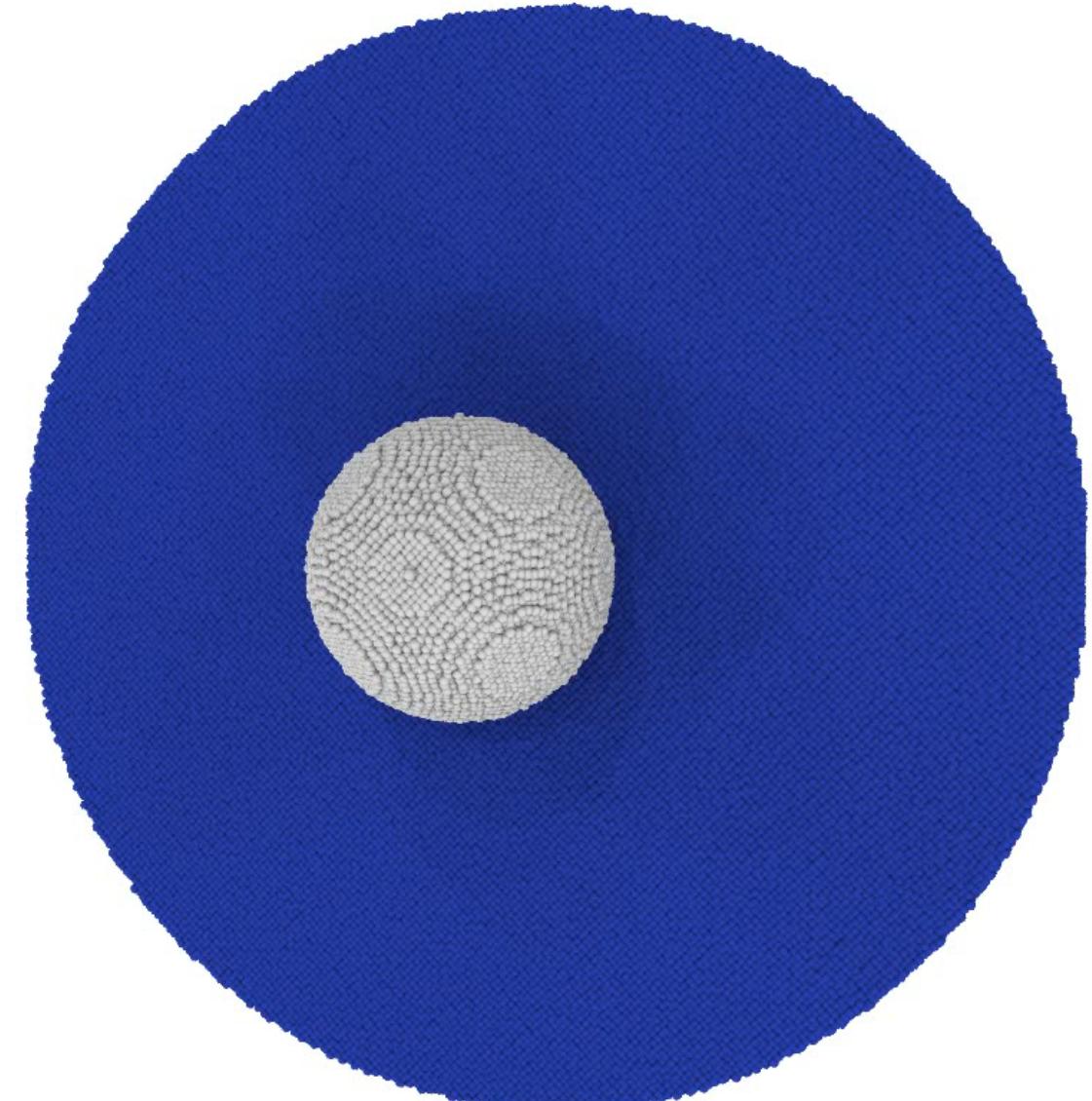
- Deformation
- Crack nucleation, growth, and coalescence
- Fragmentation
- Material flow

These phenomena present in many natural and industrial systems:

- Tectonic motion
- Ballistic impacts
- Powder compaction/grinding

Behavior depends on loading geometry, strain rates, material properties, and heterogeneities

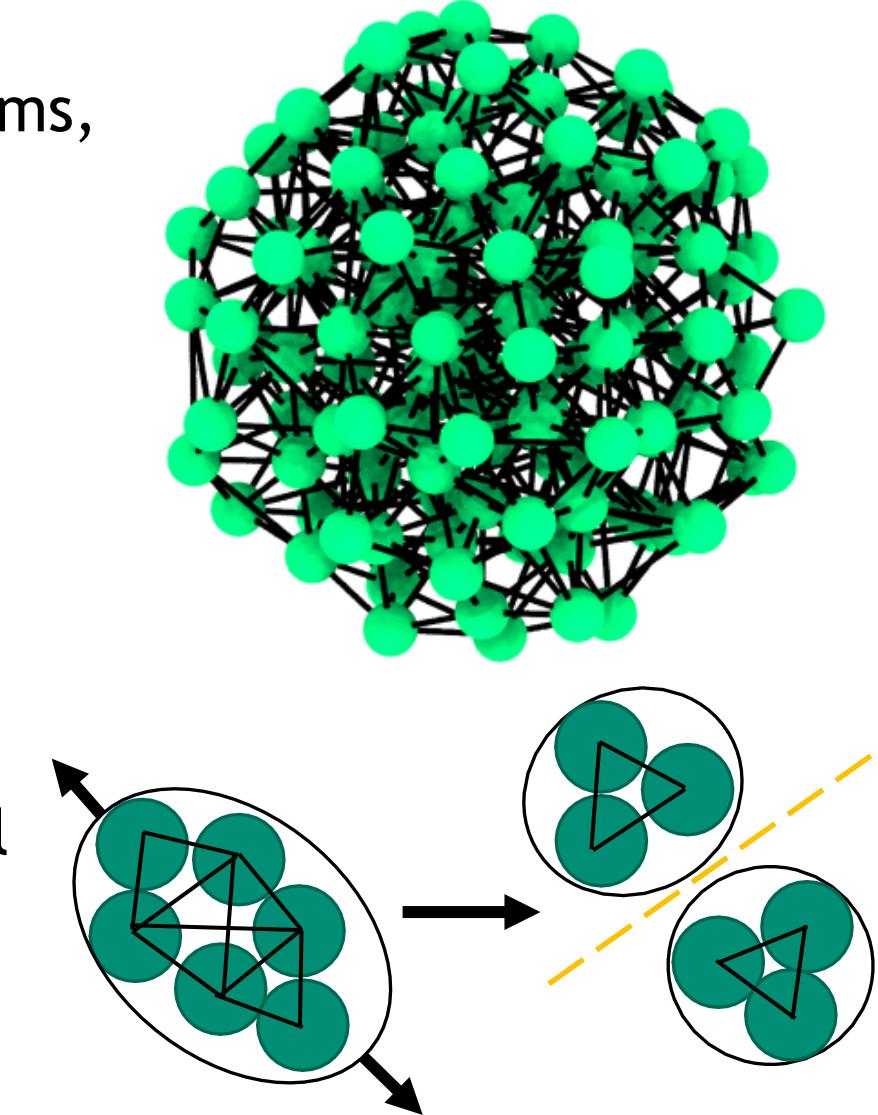
Characterization is essential for many applications  
⇒ Critical need to model these processes



# Bonded Discrete Element Model (DEM)



- Typical DEMs represent coarse-grained granular systems, each simulated particle represents one grain
- In bonded DEM, solid components are represented by collection of bonded particles - network of springs represents elasticity
- Solids can fracture by breaking bonds in network
- Can adjust bond parametrization to calibrate material properties (elastic moduli, fracture toughness)
- Many flavors of bonds for different applications, currently implementing in LAMMPS



# Advantages of approach

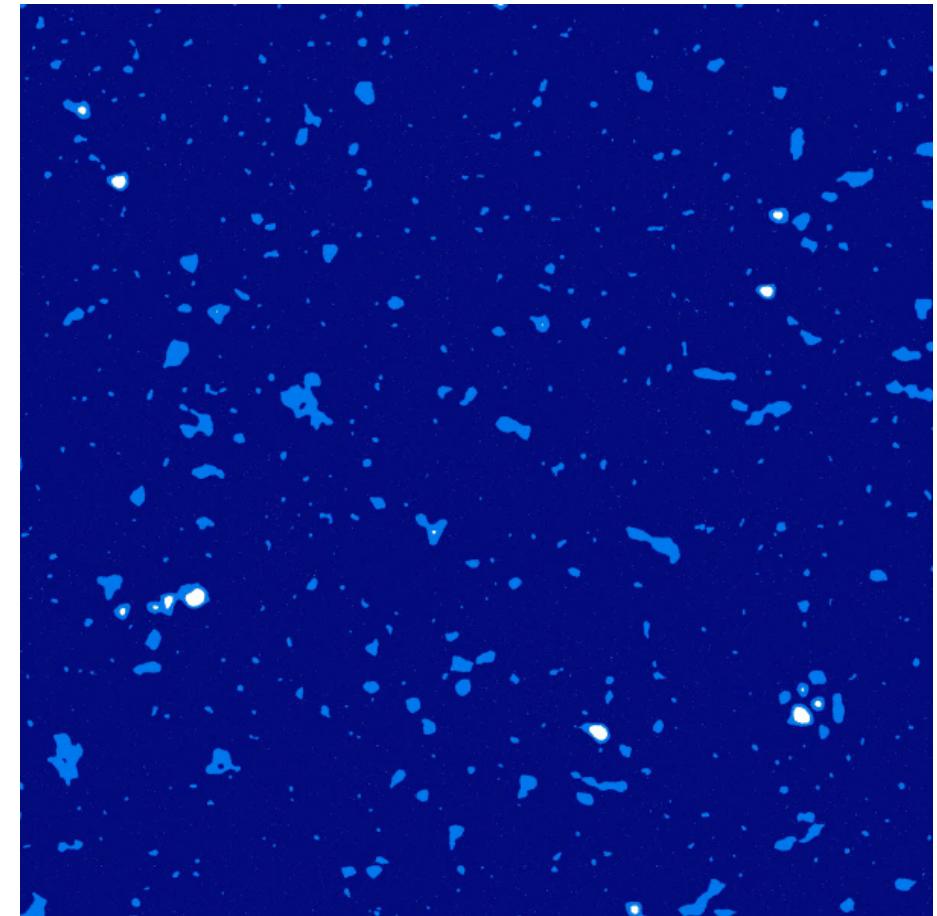


## Advantages of particle-based methods:

- Fragmentation is highly discontinuous process (contacts & cracks)
- Particles naturally treat discontinuities (meshfree)
- Full representation of stress field
- Crack growth set by physics/stress concentrations

## Advantages of DEM:

- Minimally produces emergent fragmentation
- Efficient, can simulate large systems/resolutions



# Application 1: Solid Fragmentation

In confined granular flow, dilation is limited  
⇒ Grains may need to break to rearrange

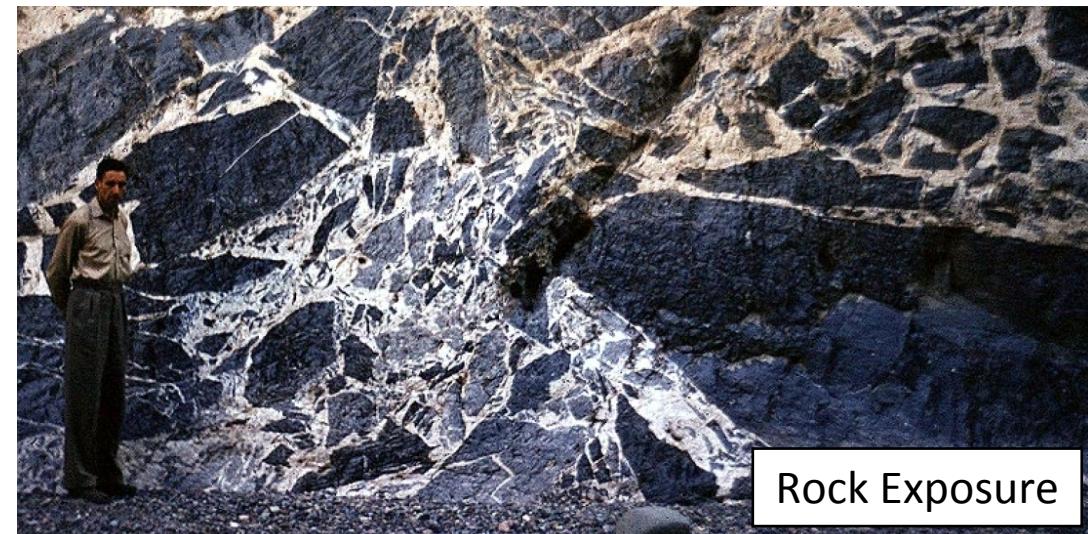
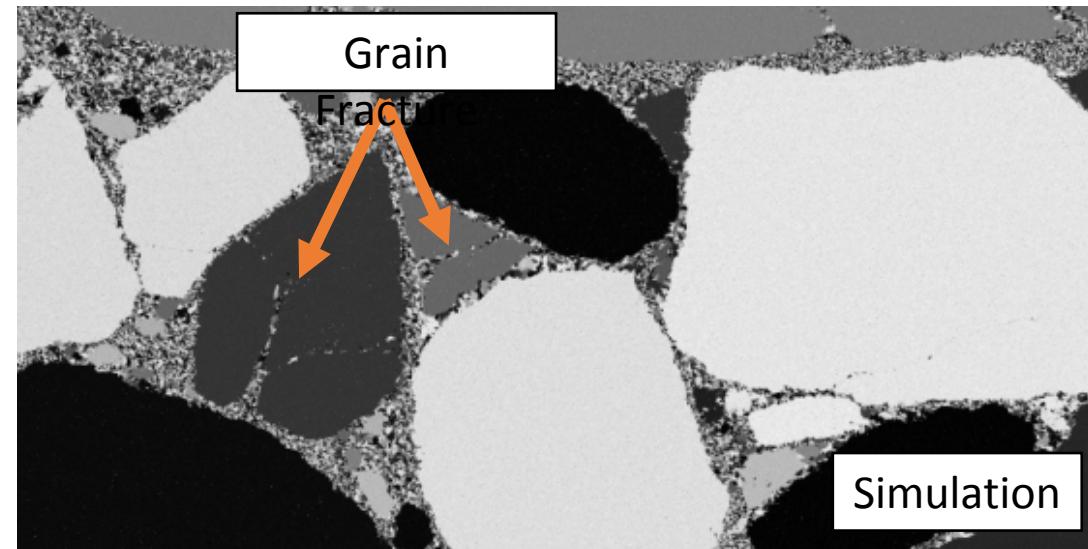
Distribution of grain sizes, often power law:

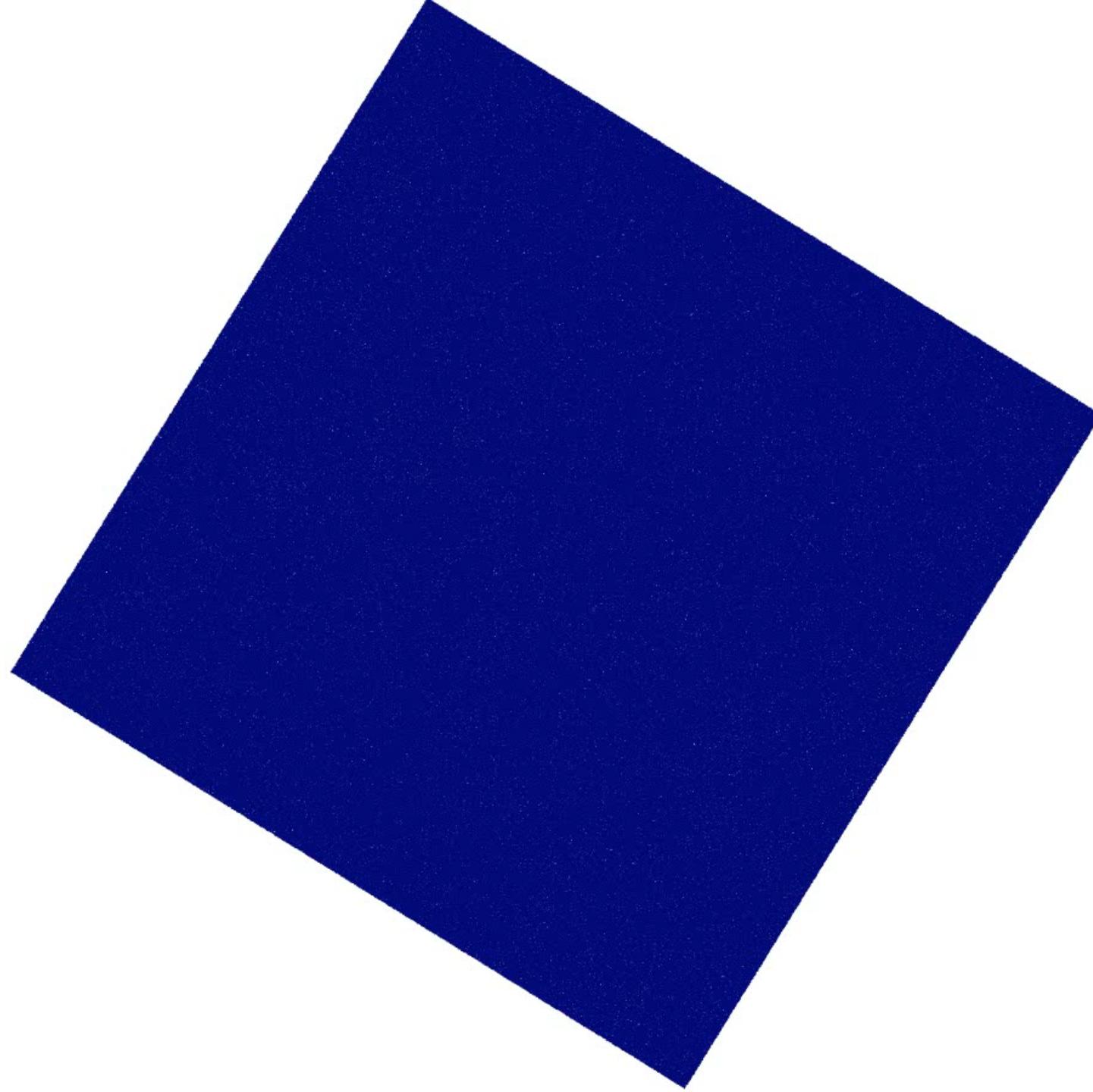
$$N(M) \sim M^{-\alpha} \quad \alpha \sim 1.5 - 2.2 \quad (\text{Turcotte 1986})$$

Comminution may be scale invariant:

- How does  $N(M)$  evolve with strain?
- What is the equivalent to a steady state?
- What is the impact of rate/material properties?
- Is this an instance of criticality?

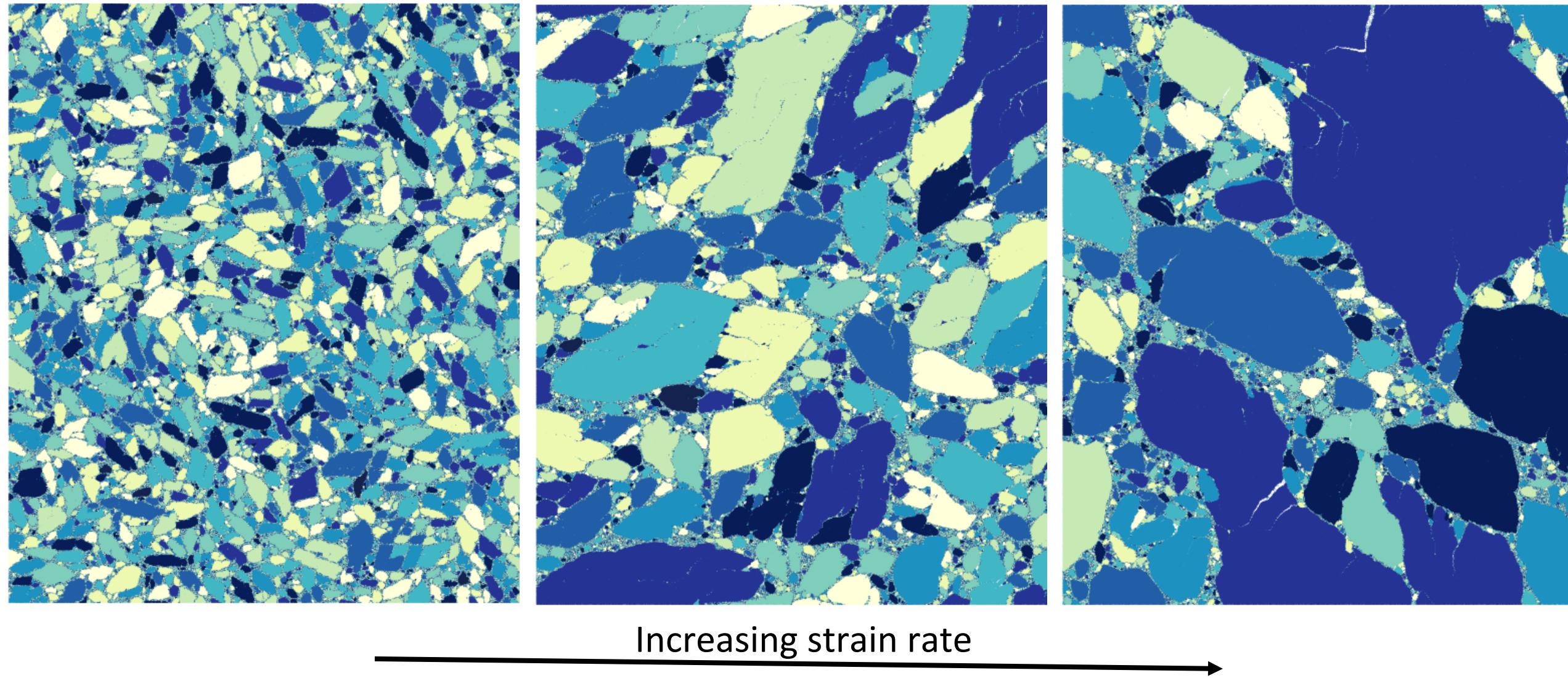
Explore using bonded DEM (Clemmer, Robbins 2021)





# Granular Medium after 150% Strain

Rate introduces characteristic length scale that decreases with increasing rate



# Rate dependent maximum grain size

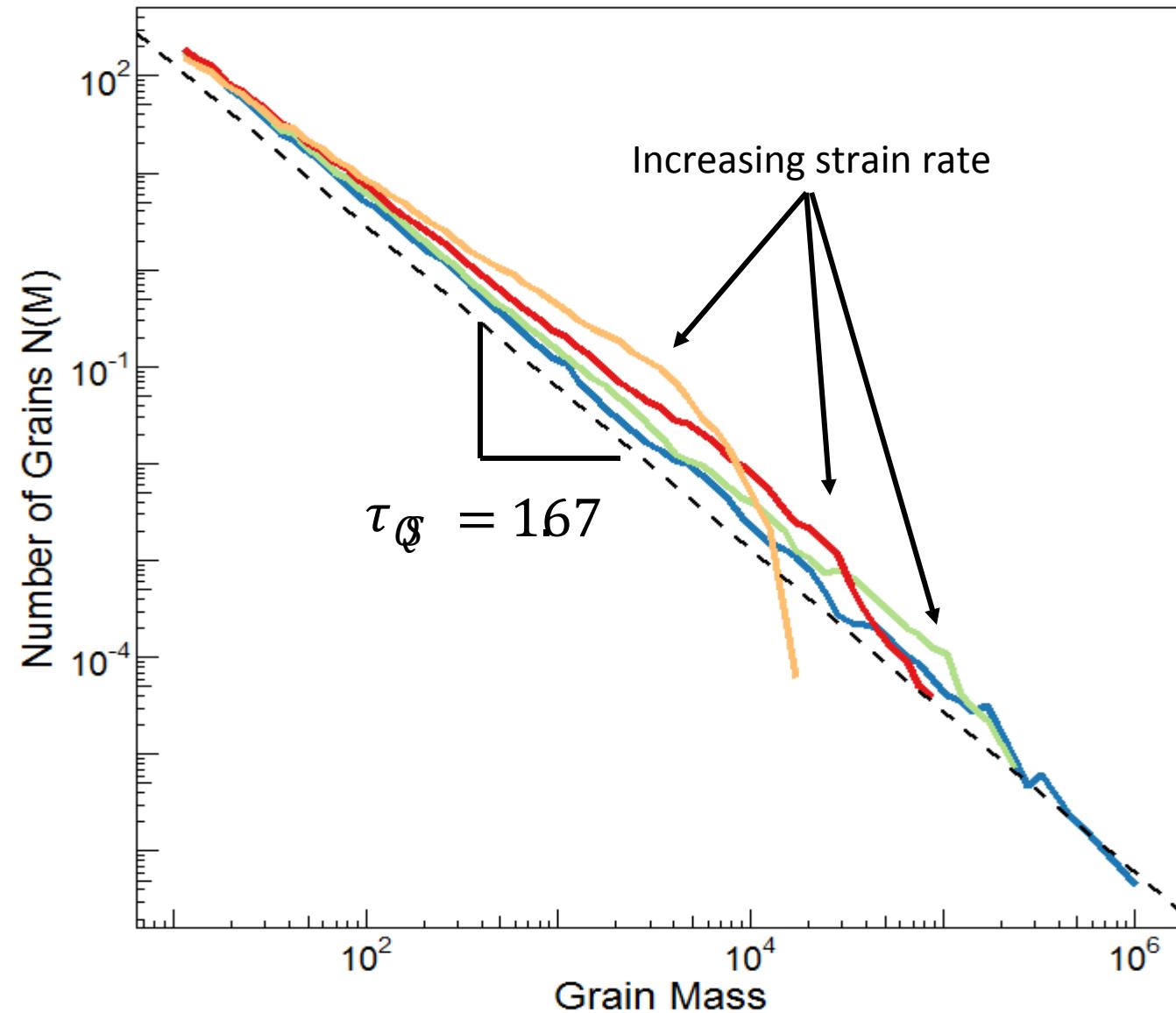
Power law extends up to maximum grain cutoff that increases with decreasing rate  
See ↑ in exponent with ↑ in rate

As strain increases, power law extends to larger lengths within QS limit

At finite rate, exponents changes with strain

No detected dependence on material properties (moduli, fracture toughness)

Could partially explain variety of power laws seen in particulate materials: loading conditions determine distribution



# Application 2: Powder Compaction

- Increasing pressure densifies system, different mechanisms:
  - Rearrangement
  - Deformation
  - Fracture
- Fragmentation relatively poorly understood:
  - How does fracture depend on macroscopic stress?
  - How does packing fraction evolve at high  $P$ ?
  - What's the effect of defects/porosity?
  - Are fragments power-law distributed? Critical?
- Use bonded DEM to begin answering these questions



Uniaxial compression of microcrystalline cellulose

# Simulations of compaction



Simulate compaction of 100 spherical grains each consisting of 45k particles

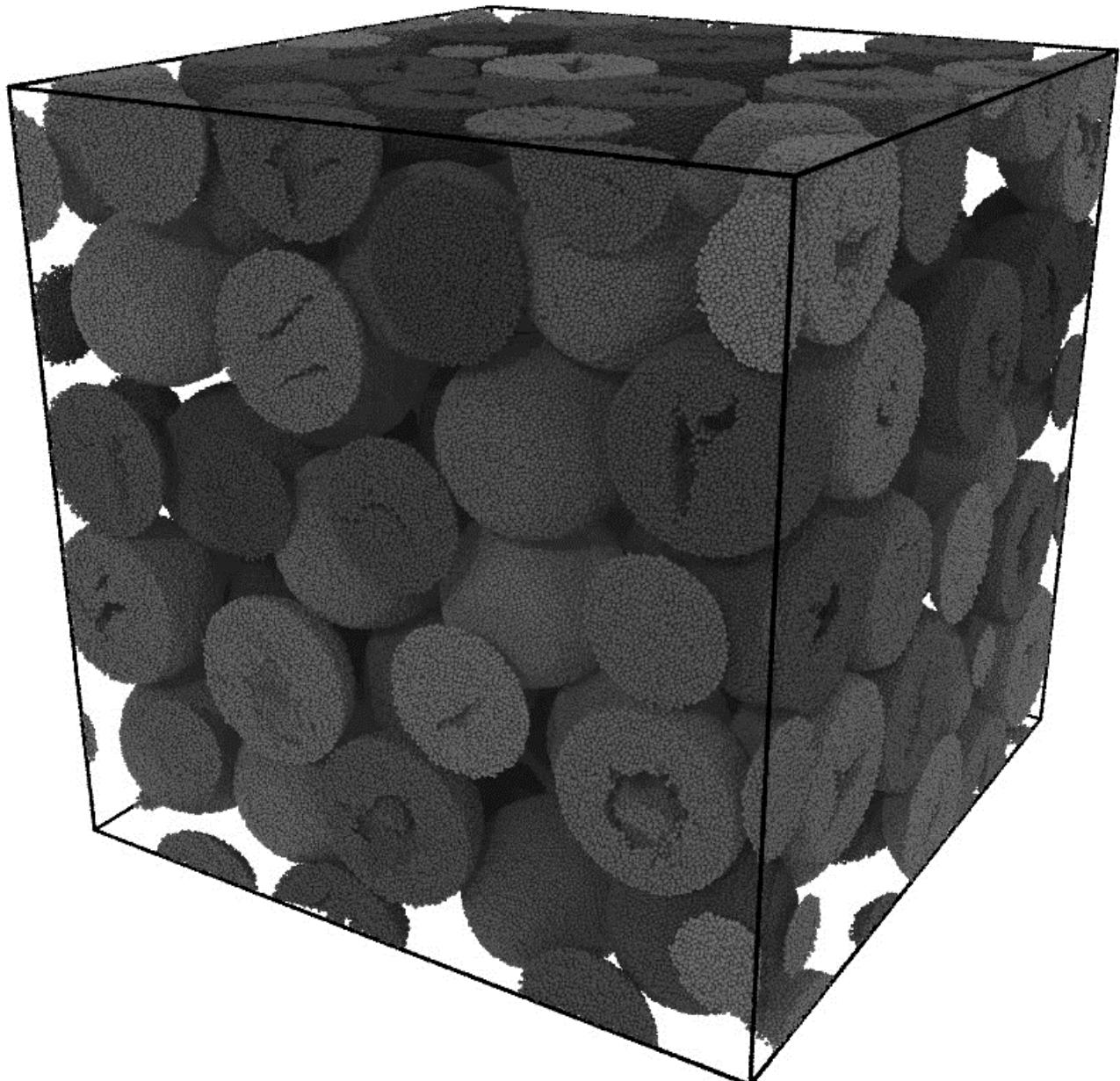
Use microCT images of powder feedstock to apply realistic defect geometries

Can identify:

Rearrangement

Deformation

Failure of grains - fracture



# Failure as a function of shear and pressure



Yield surface: extent of jammed, elastic regime

Low P increase shear:

Flows above internal friction:  $\sigma/P > \mu$

Find  $\mu \approx 0.32$  - typical for materials

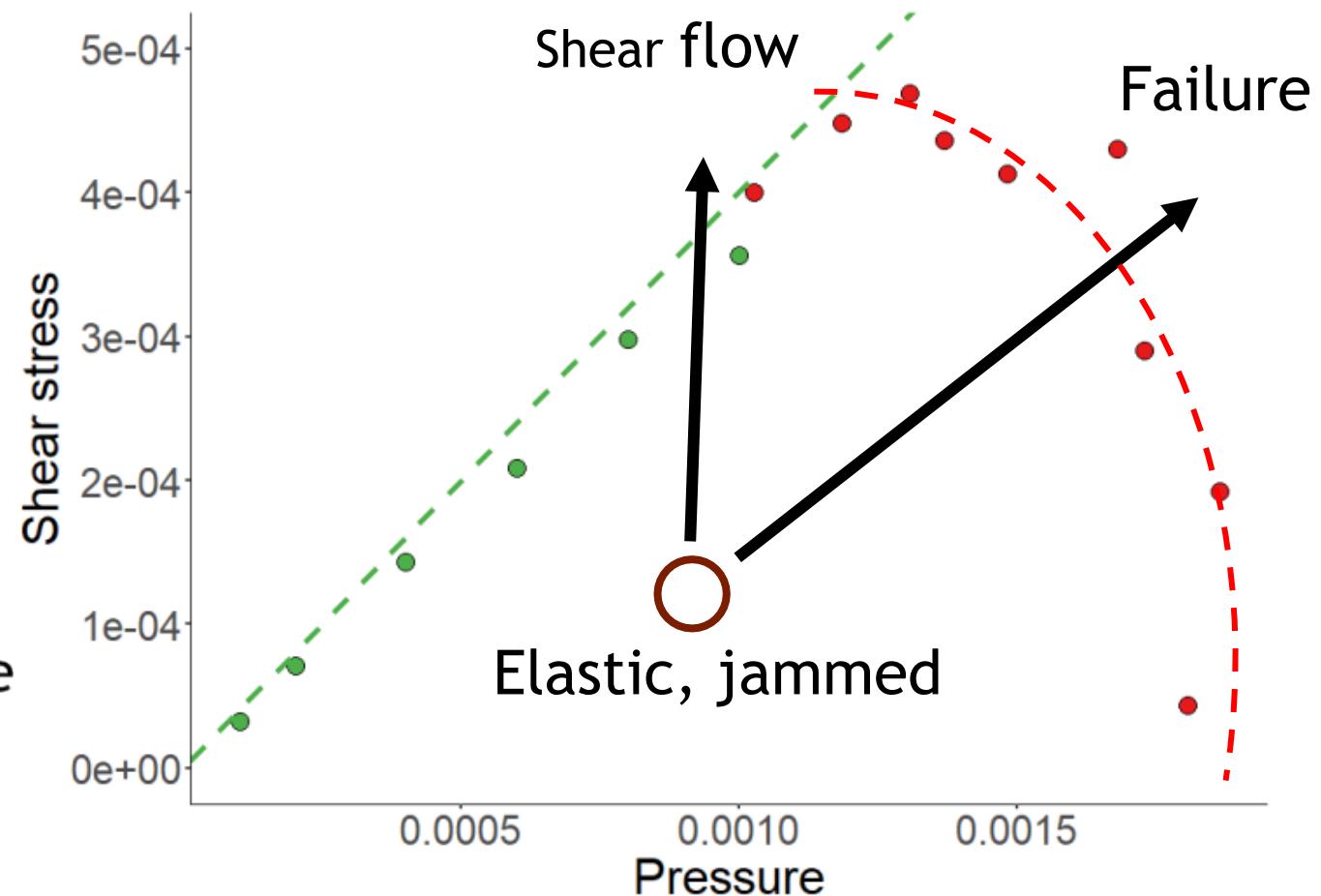
No dependence on grain porosity

No fragmentation

High P and/or shear:

Fails at shear stress dependent pressure

Can evaluate shape of compaction cap,  
e.g. Drucker-Prager



# Isolating strength of individual grains



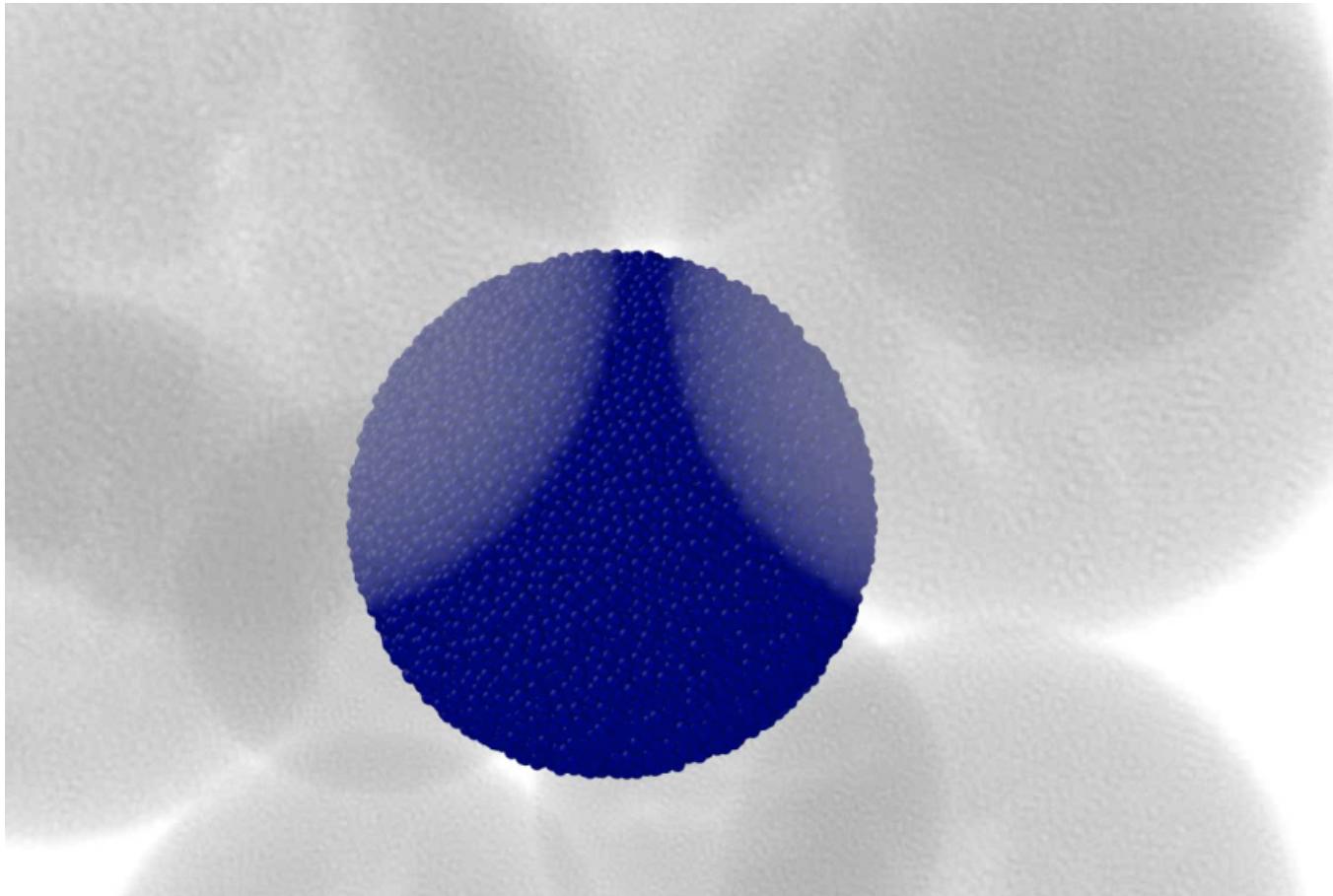
Bulk yield is set by weakest grain

Strength of a grain depends on both:

- 1) Internal porosity and orientation
- 2) Local environment  
(loading geometry)

Probe variation by isolate single grain failure: preventing bond breakage in surrounding grains

=> Measure strength of every particle



# Strength distribution of grains



Find highly skewed distributions  
Long tail implies some grains very strong

Vary shape of defects (curve colors), can  
quantify reduction in strength

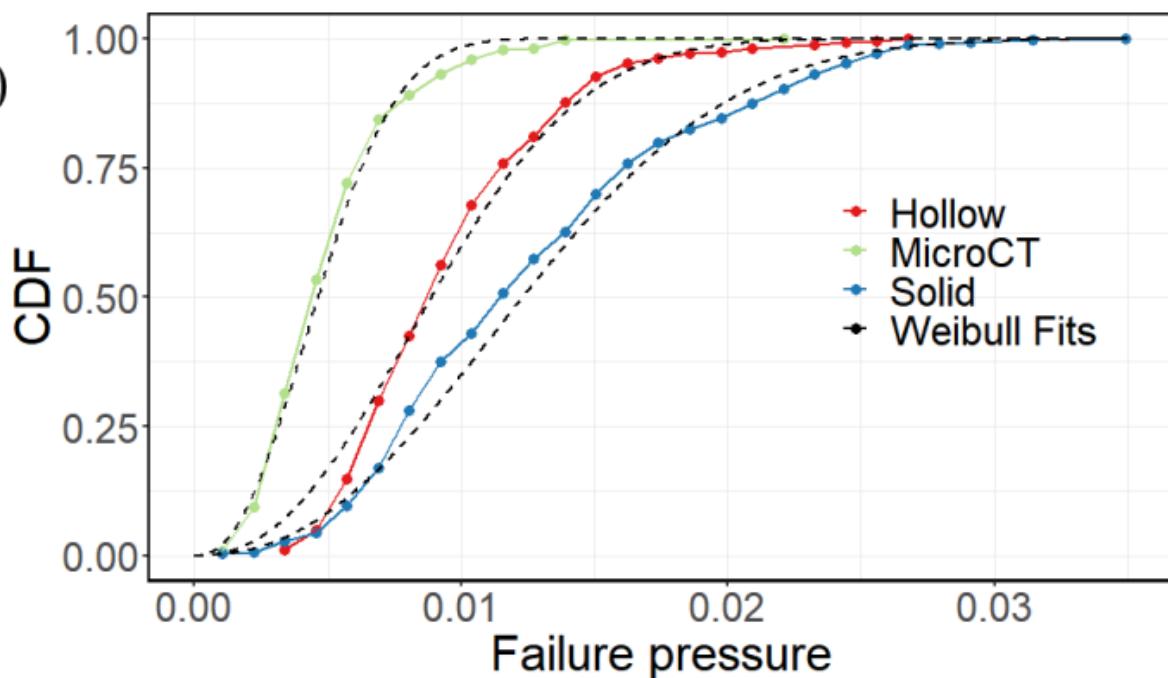
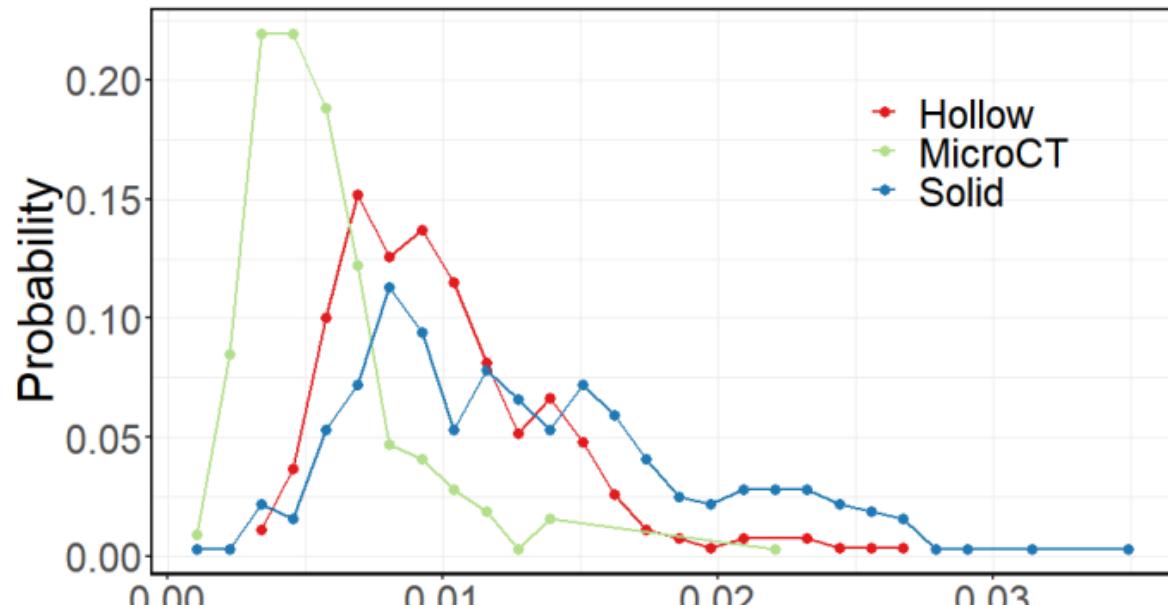
Theorized that distribution determines  
shape of compaction curve (Kenkre et al. 1996)

All fit well by Weibull distribution

$$CDF = 1 - e^{-(P/P_0)^k}$$

Constant exponent  $k = 2.3$

$P_0$  depends on defects



# Summary



Particle-based methods are shown to be an effective solution for the many challenges in modeling fragmentation in brittle materials

Bonded discrete element models (soon to be released in LAMMPS) can be applied to probe fundamental mechanics of comminution and granular fracture





# Extra Slides



# MS204: Upscaling of particle scale mechanics to continuum macroscale phenomenology

- *Many physical processes exhibit complex constitutive behavior attributable to grain (or particle) scale thermo-mechanical processes inherent to their microstructures and possible interactions with interstitial fluids. These processes often involve different length and time scales and interaction among them, requiring quantifying mechanical behaviors across the different scales and identifying connections between them. Examples of such materials may include soil and rock, pressed powders, ceramics, concrete, sprays and droplets, suspensions, among possibly others. This symposium provides a forum to present and discuss approaches for bridging particle scale mechanics to the continuum scales of interest for engineering applications both with and without effects of fluids. Topics within the scope of interest include but are not limited to:*
- *Micromechanical models with focus on associated homogenization theory for effective response,*
- *Statistical approaches of scale-bridging techniques,*
- *Data-driven multiscale modeling techniques,*
- *Microstructural and crystallographic characterizations with data reduction related to effective properties,*
- *Experimental efforts related to specific method developments.*

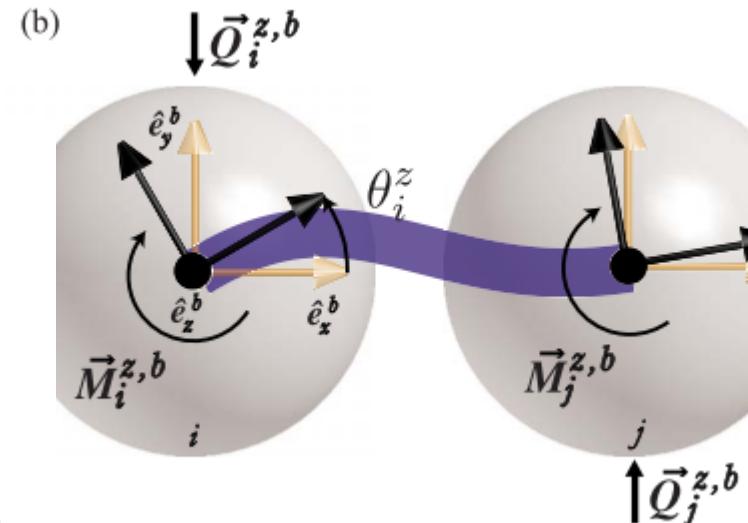
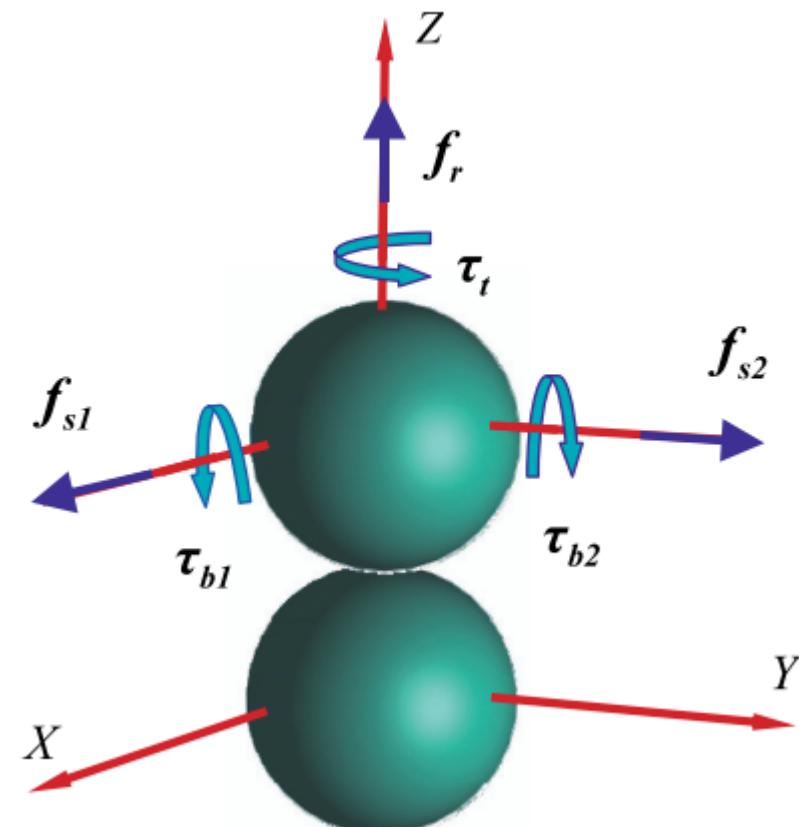
Under large loads, deformation of brittle particulate materials will eventually lead to particle fracture and failure. The process of fragmentation is very complicated and depends heavily on not only the specific conditions of loading but also on material heterogeneities such as internal porosity and local particle packing. As a solid is loaded, some set of material defects will nucleate cracks. These cracks will grow, interact, and possibly coalesce leading to failure. In order to accurately model such phenomenon, one needs to resolve the local stress field and also handle the dynamic initiation and propagation of discontinuities. Discrete element models (DEMs) are particularly well suited to these challenges. DEMs represent a solid as a collection of interacting Lagrangian points. The failure of bonded interactions between such points naturally produces discontinuities in the system. Such models have been used in a wide variety of contexts and exhibit their capabilities through the emergence of experimentally observed behavior such as the growth of wing cracks in a uniaxially compressed solid.

In this talk, we discuss recent work designing, calibrating, and implementing a variety of DEMs into LAMMPS, a powerful and popular codebase for large-scale, parallel simulations. A variety of applications will then be discussed to highlight the flexibility and strength of the models. These will include studies of rate effects on the density of crack nucleation and the subsequent damage accumulation in uniaxially compressed solids as well as granular breakup in sheared solids. The sheared solids are found to approach a critical state in the limit of small strain rate which is characterized by a power-law distribution of grain sizes. We focus on the problem of granular compaction which is relevant in many industrial processes such as tableting. At high pressures, fracture of grains is the primary mechanism of densification and produces complicated distributions of irregular particles. We start with uniform packings of spherical grains and simulate applying a variety of loads at different rates to study yielding as well as the evolution of the stress, porosity, and grain size distributions.

## Variety of DEMs

Carmona, Wittel, Kun, Herrmann 200  
Andre Iordanoff, Charles Neauport 20

Wang Mora 2008



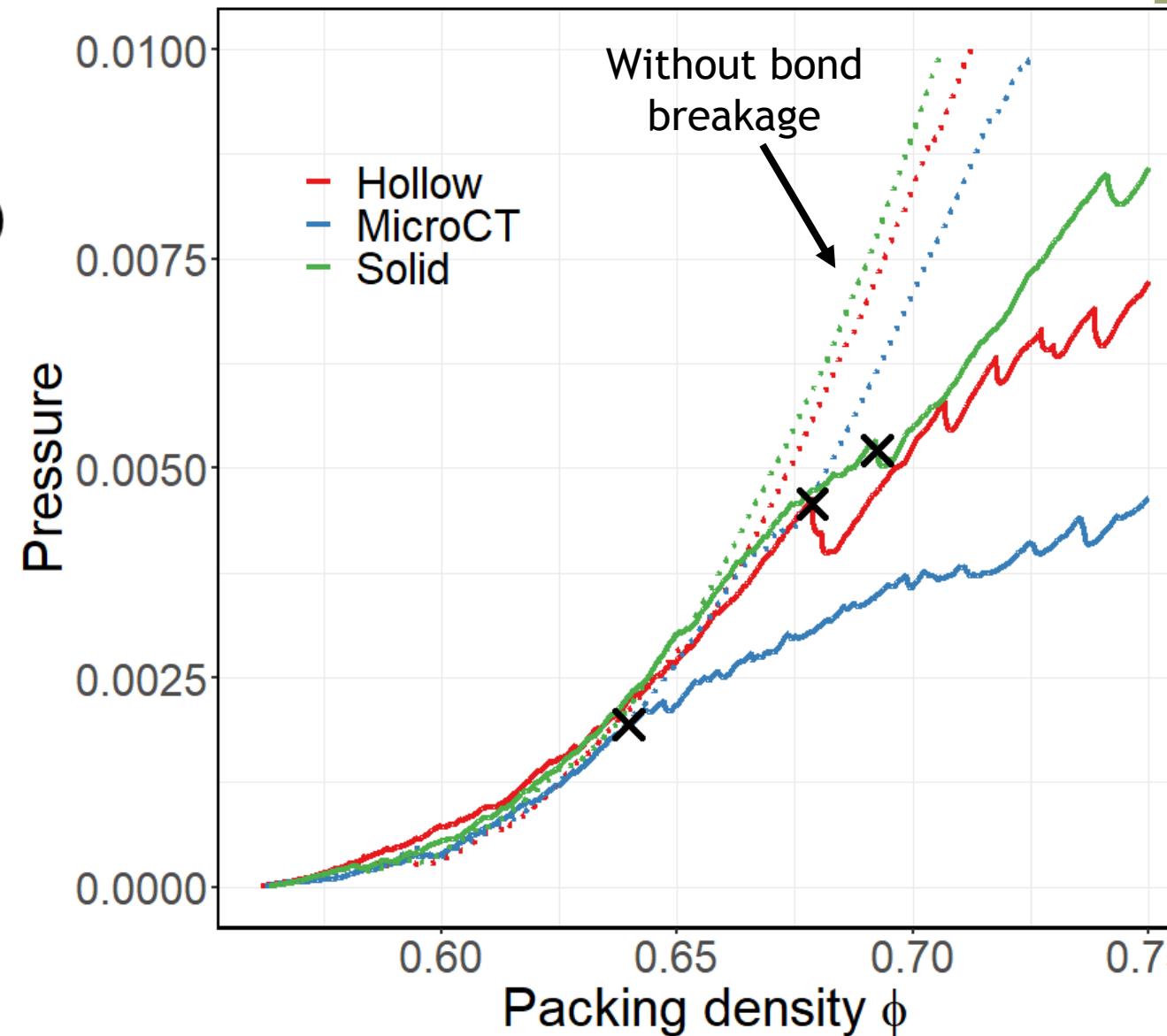
# Compaction curves

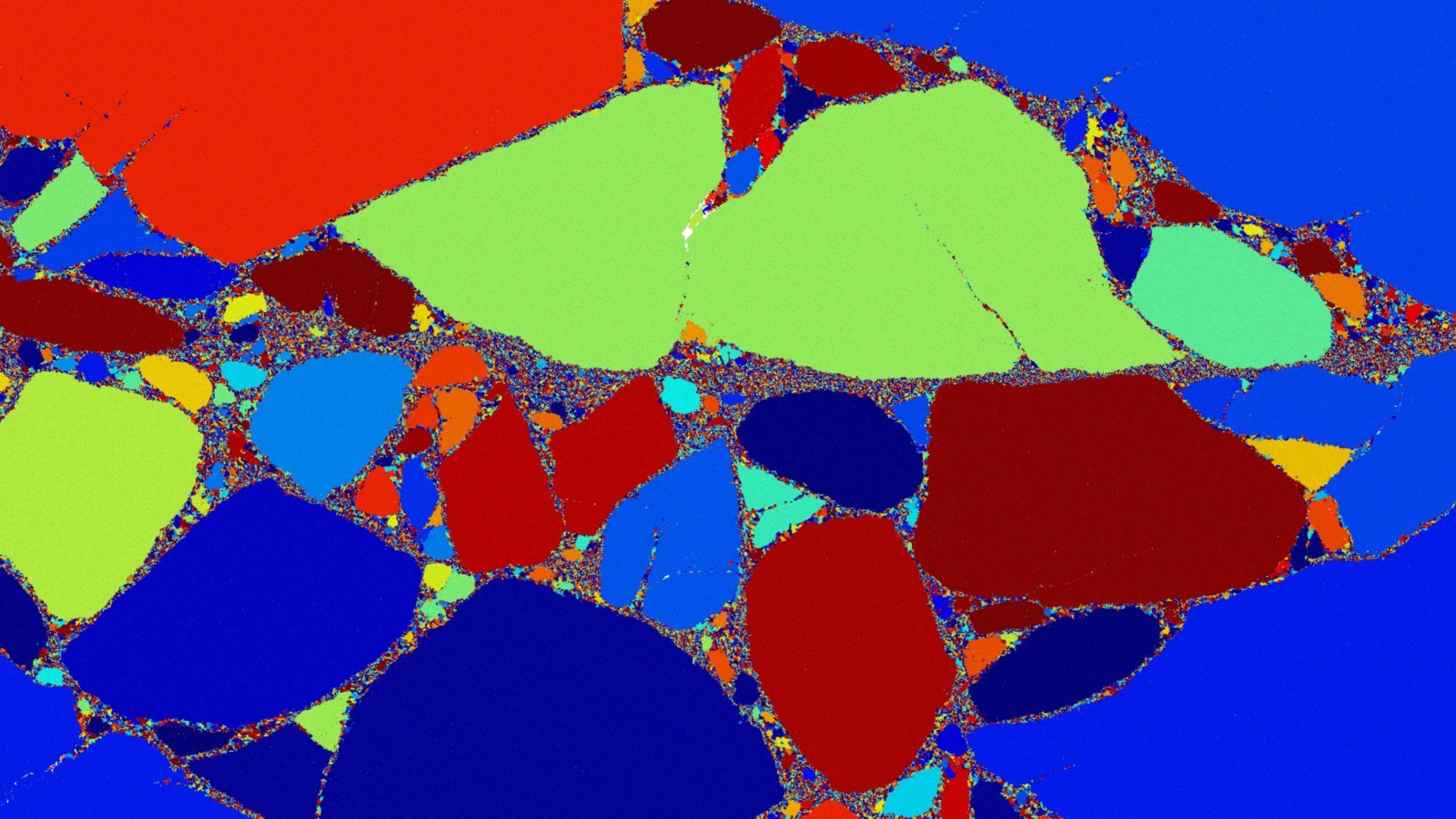


Pressure rises at packing density  $\phi \sim 0.57$   
 Friction  $\downarrow$  jamming  $\phi$  from 0.64 (Silbert 2010)

Small  $\phi$ : see rearrangement  
 Large  $\phi$ : see deformation  $\rightarrow$  damage  $\rightarrow$  failure  
 (indicated by black X's)

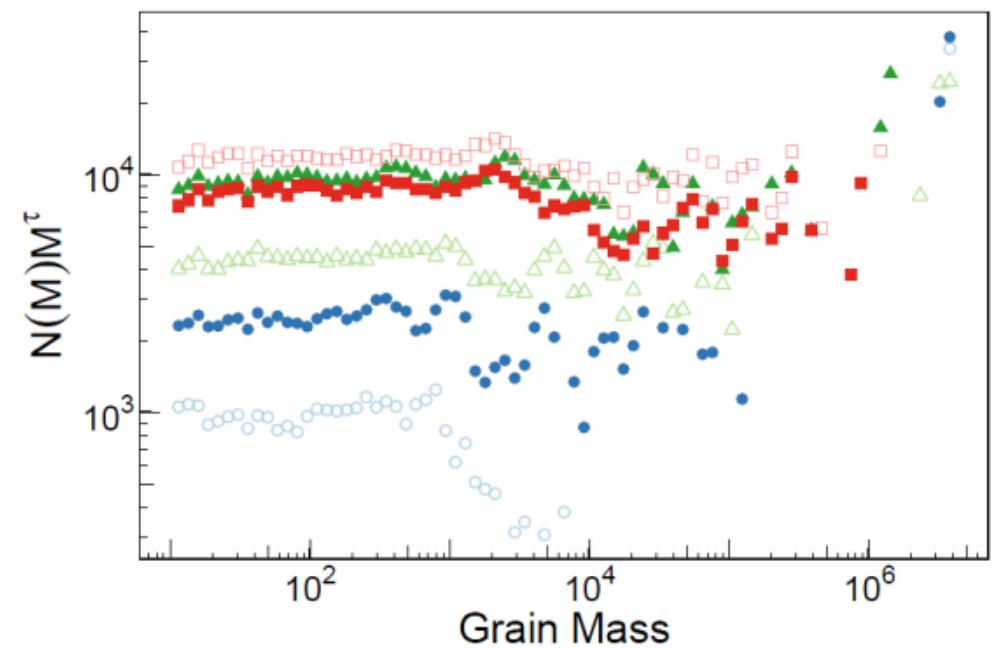
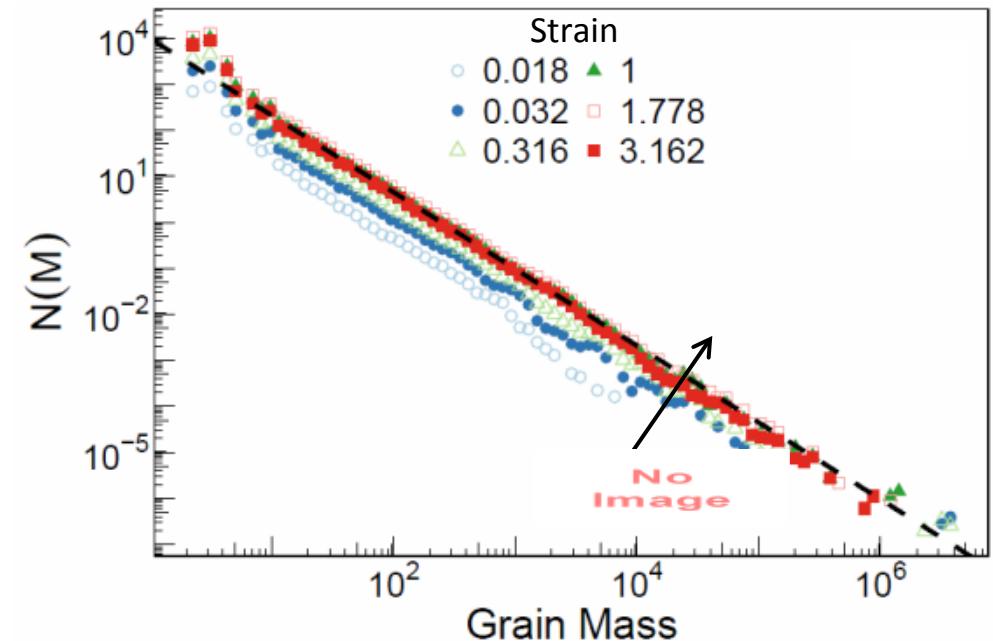
Can study theoretical curves without  
 fragmentation to highlight its impact  
 Note: porosity reduces stiffness of system





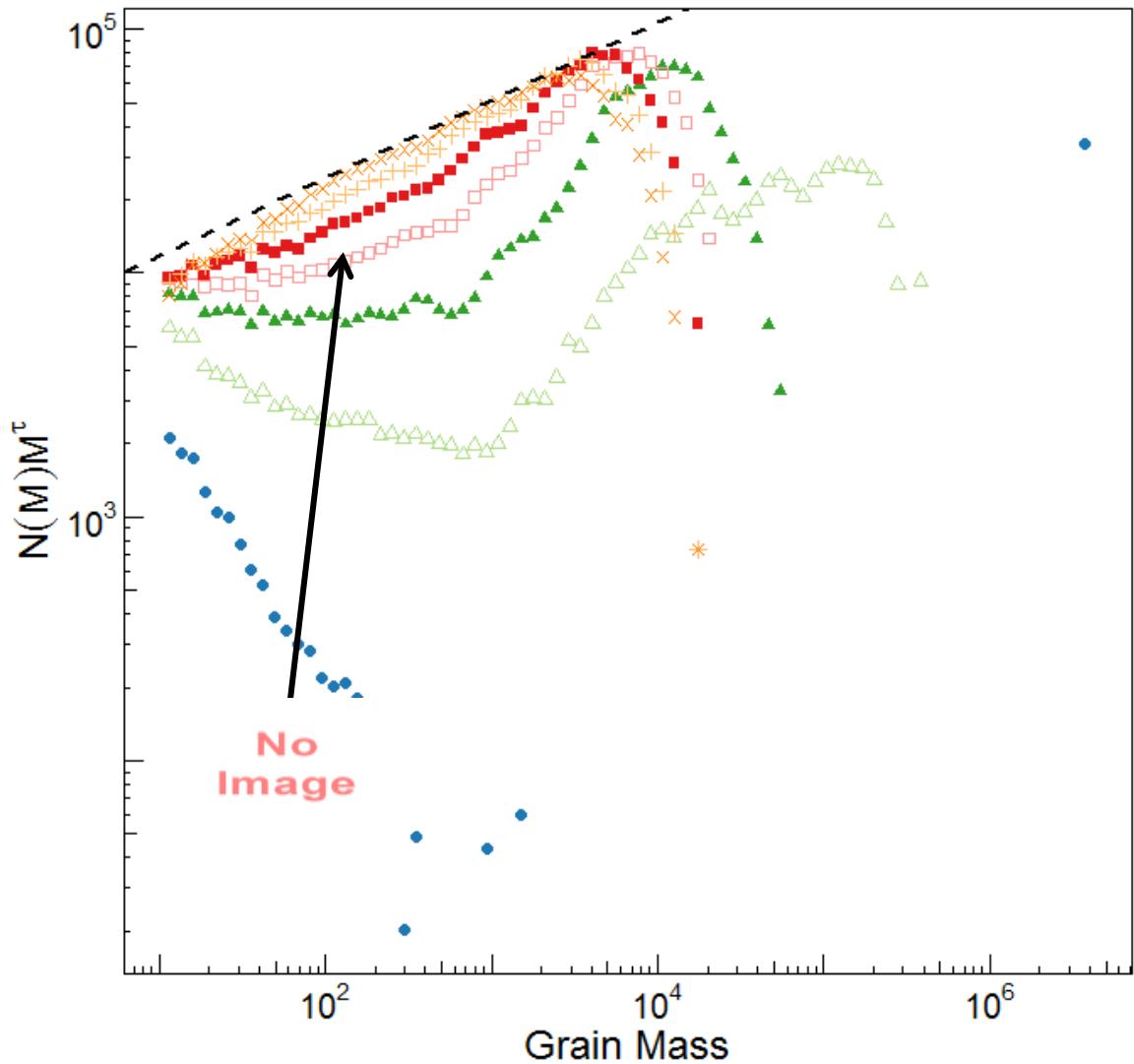
# Grain Size Distribution

No  
Image



# Rate dependent exponent

No  
Image



# Impact Defects on Fracture - Preliminary

Study interaction of strain rate  
and defect density on initial  
failure

Use realistic initial defect  
distribution from micro CT scans

Moorehead et al. 2018

Track evolution of crack  
distribution – calculate damage

# Impact Defects on Fracture - Preliminary

Study interaction of strain rate  
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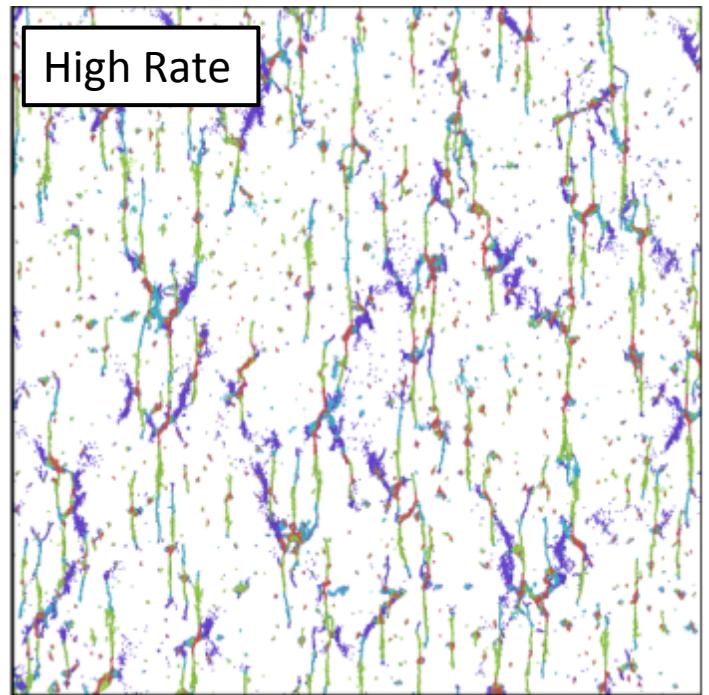
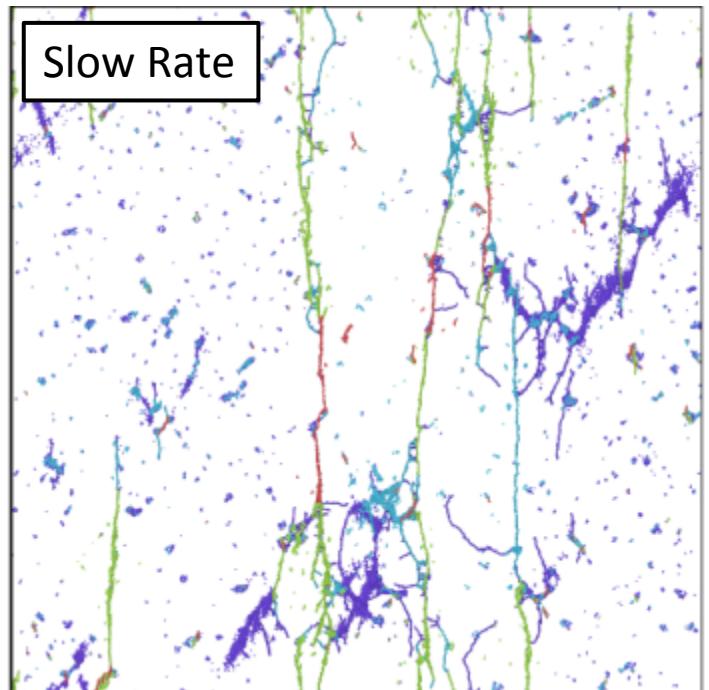
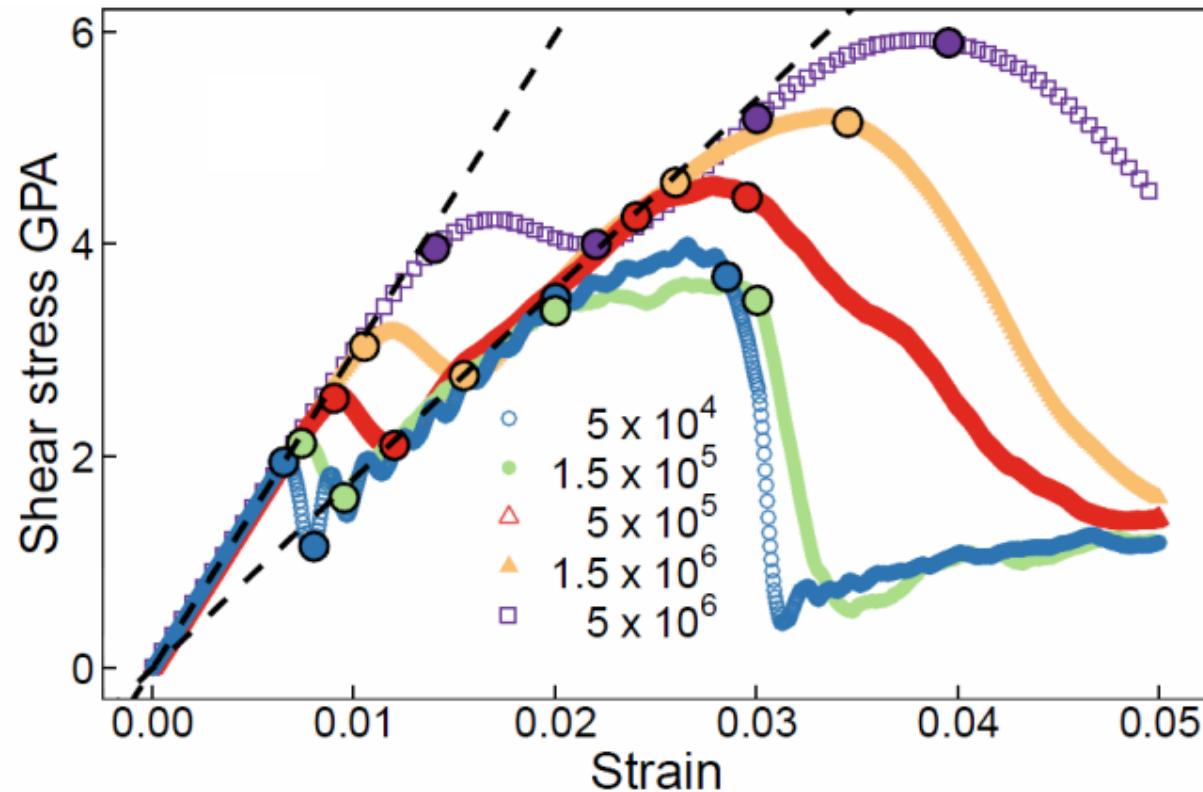
Use realistic initial defect  
distribution from micro CT scans

Moorehead et al. 2018

Track evolution of crack  
distribution – calculate damage

# Rate Effects

Increased strength at high rates, increased number of cracks/defects active in failure

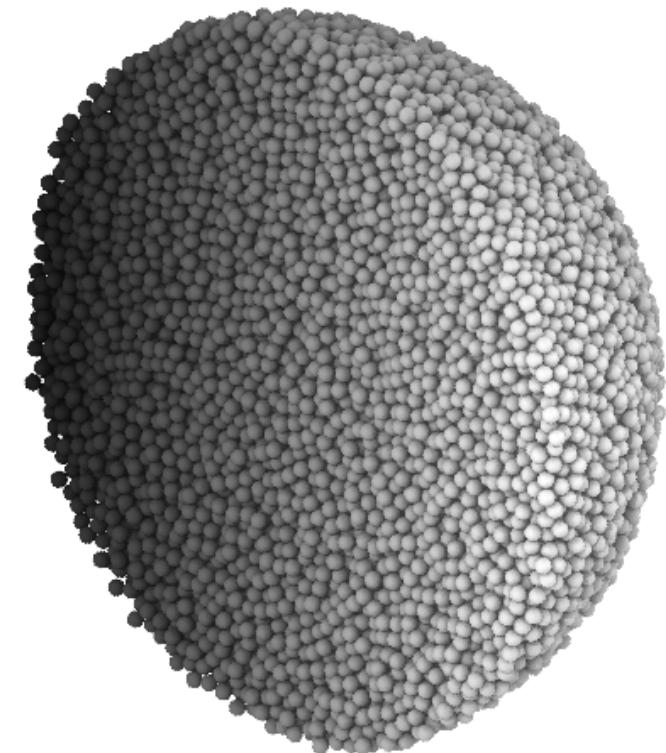
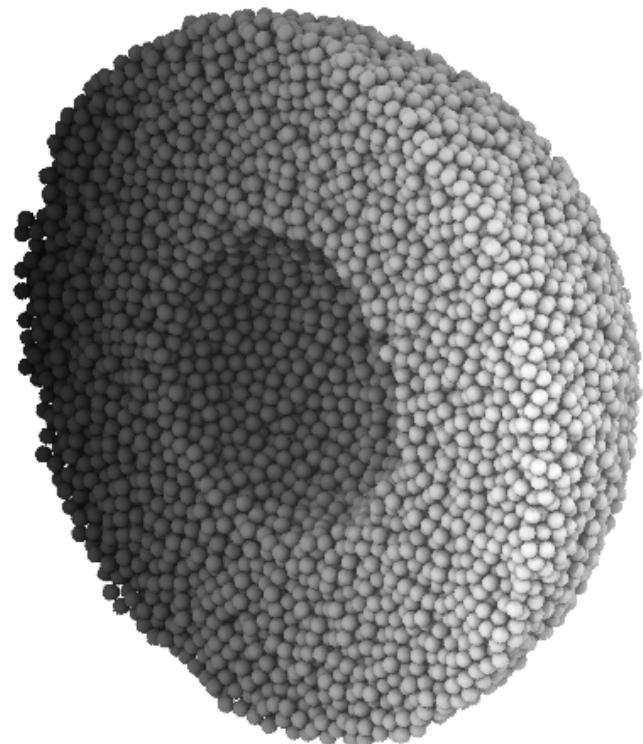
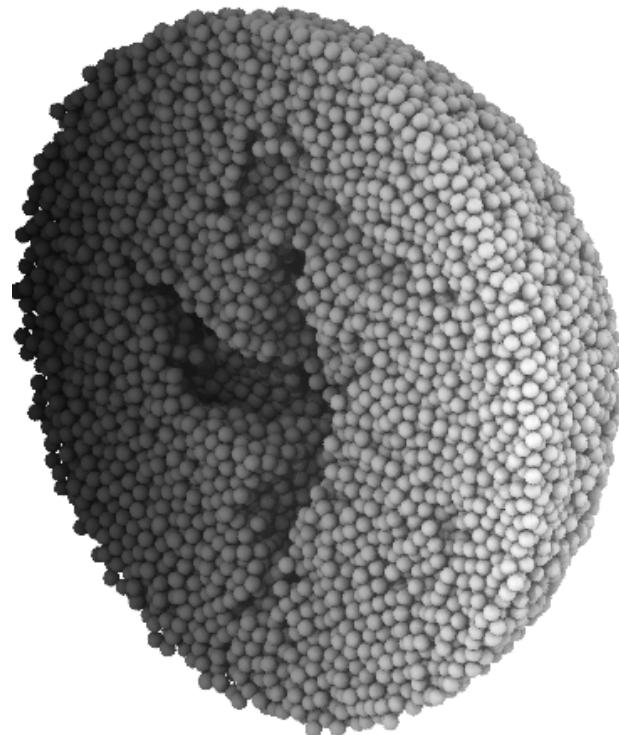


# Defects in DEM Grains



Goal: quantify effect of porosity/defects on granular strength and fragmentation

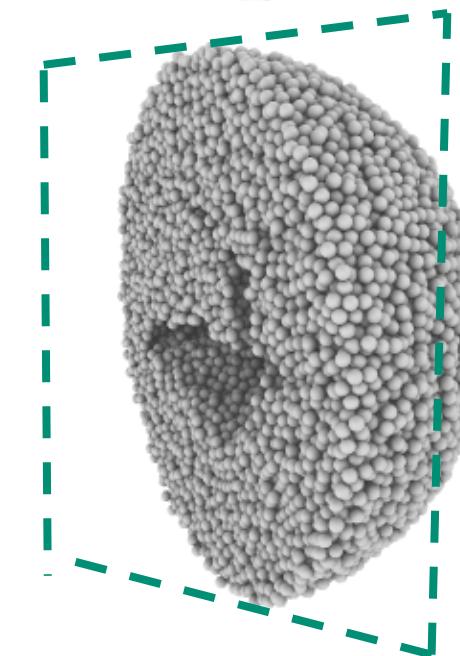
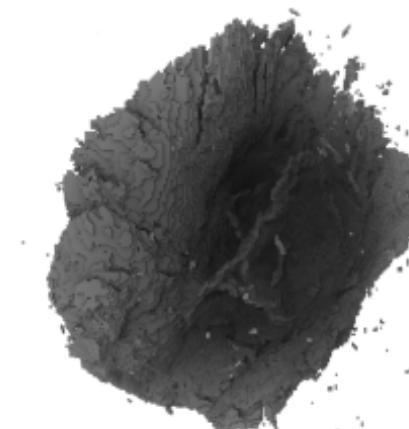
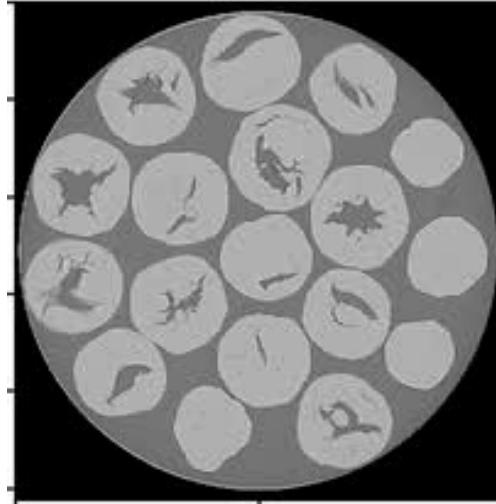
Study 3 types of grains: realistic porosity, uniform porosity (hollow), and solid



# Defects Derived from Microcrystalline Cellulose



Process CT Images → Create library of internal voids → Carve out region in spherical DEM grains

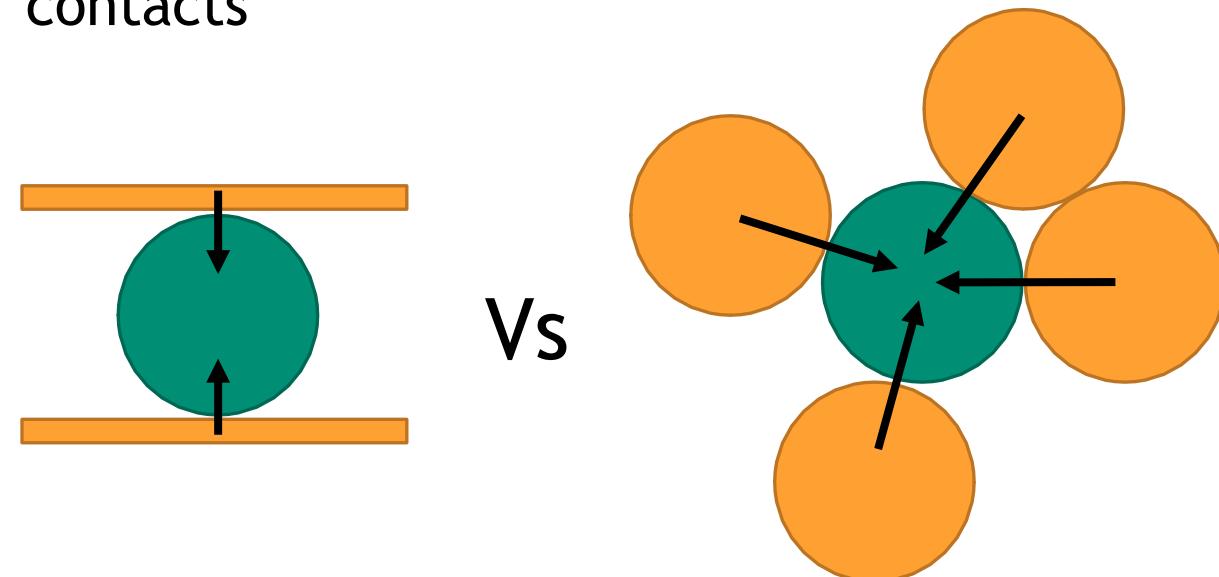


# Measuring Strength of Grains



Could measure strength under uniaxial strain  
(e.g. Brazil test)

However, grains in a packing experience very different loading geometry: many shifting contacts



Instead focus on actual particle packings

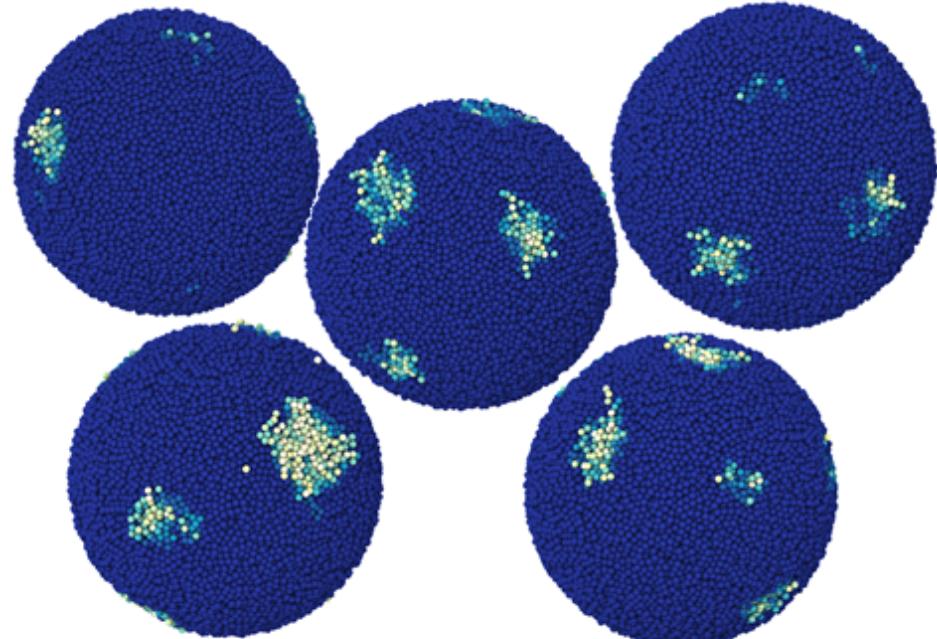
# Granular Damage in Compaction – Defining Failure



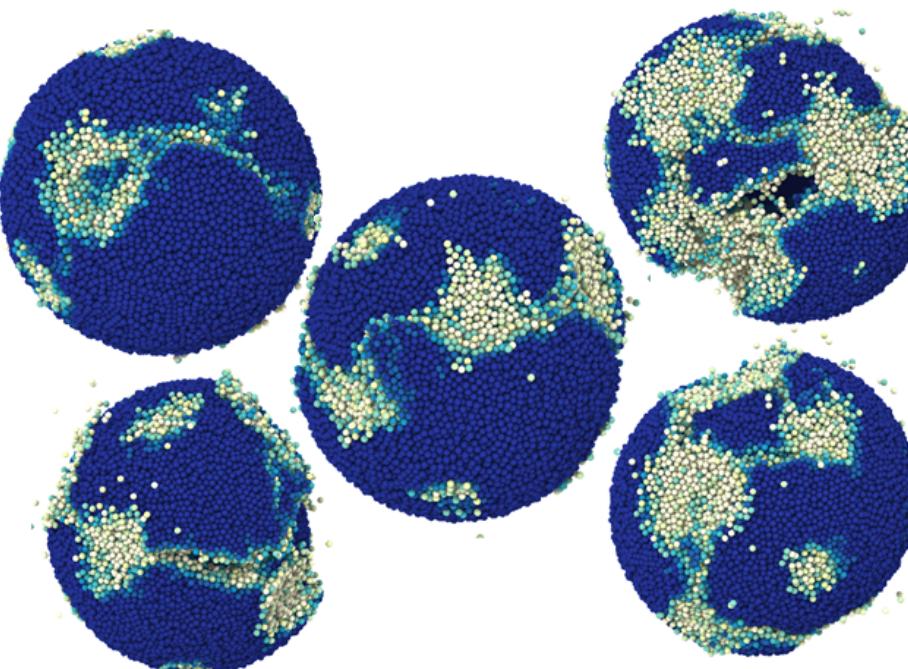
As grains slide past each other, damage (broken bonds) can occur on the local contact even at lower pressures - abrasion

At higher stresses, cracks nucleate and grow as grain fractures - our definition of failure

Abrasion



Fracture/failure



# Porosity effect



Changing porosity, still see highly skewed distribution w/ long tail

↑ mean and variation for hollow/solid grains

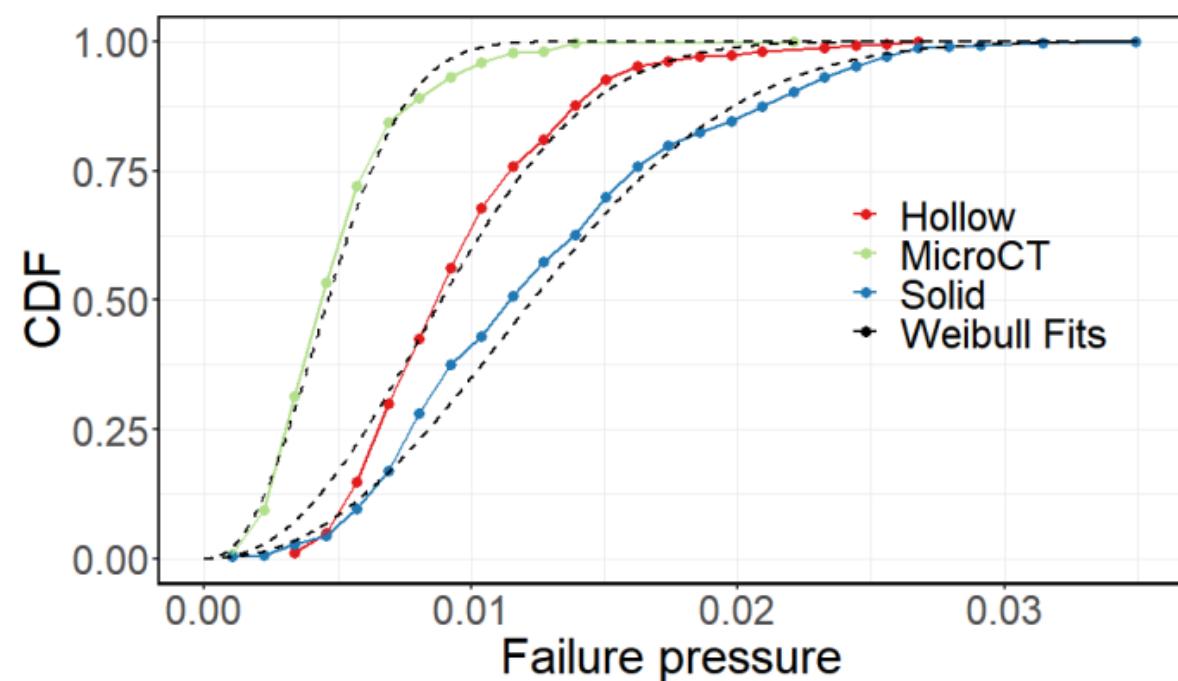
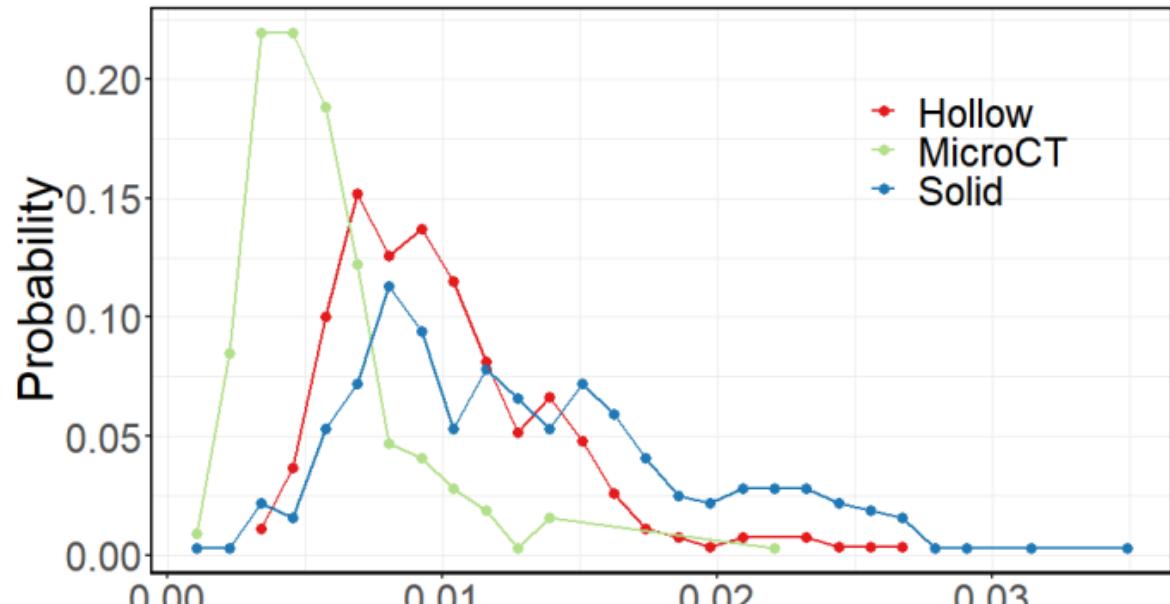
Note while solid grains generally stronger than defected, environment still very important as some solid grains are weaker

All fit well by Weibull distribution

$$CDF = 1 - e^{-(P/P_0)^k}$$

Constant exponent  $k = 2.3$

$P_0$  depends on defects



# Isolating Effect of Defects



Given a fixed local environment, can we compare loss in strength due to defect?

Run compaction with identical packing configurations with defected and solid particles

Use solid strength to ‘normalize’ defected strength, look at relative loss of strength due to defect

