

Memory in granular materials

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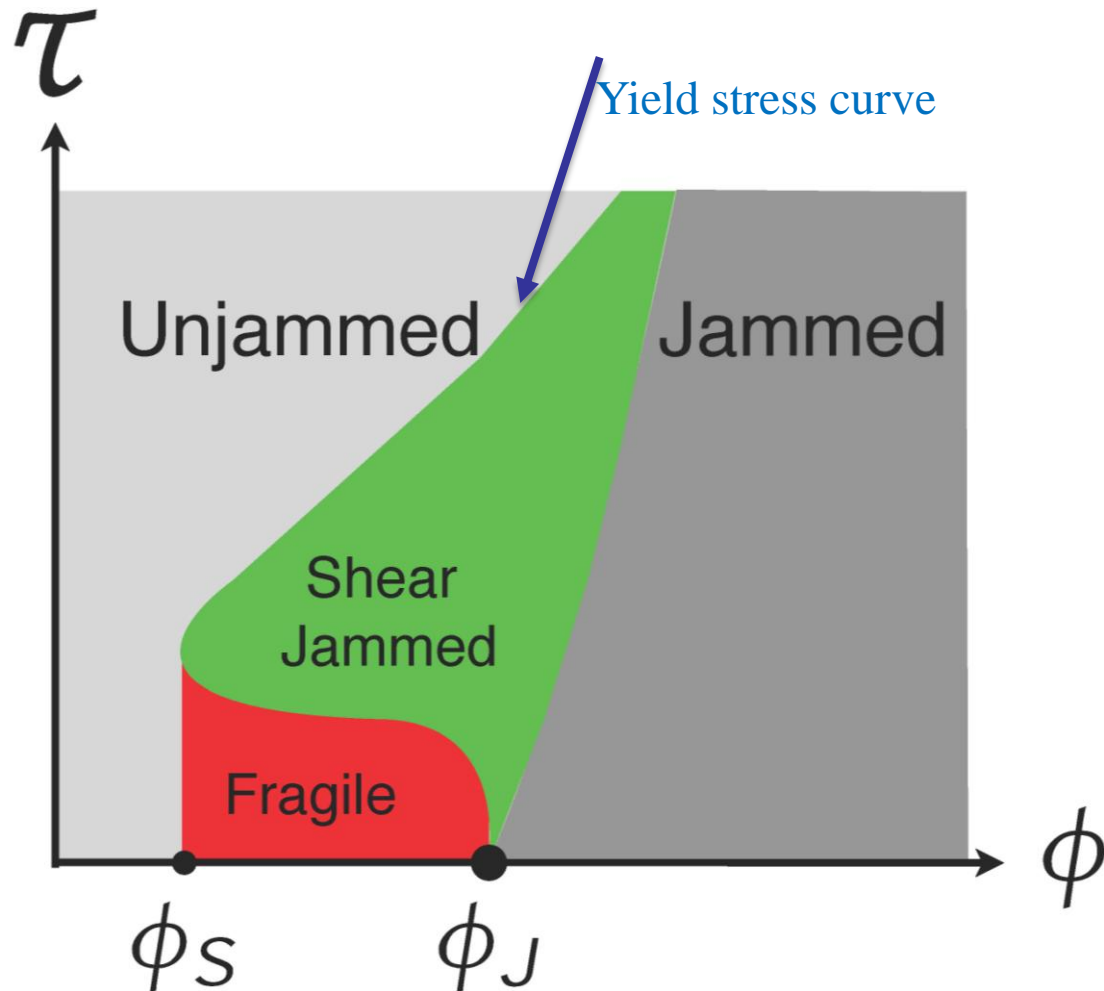
Premise: Granular materials respond to strains by forming networks—these reflect a memory of the initial state plus strain protocol

- Background
 - Shearing—can rewrite memory, but also reproduce previous states
 - Particles: elastic (soft) and frictional
 - Force networks and protocols
 - Experimental techniques
 - Shear jamming phase diagram
- Cyclic shear systematically rewrites memory—activation by shear amplitude
- What are the microscopic processes that cause shear jamming, and also rewrite the networks

Context

Shear stress τ vs. packing fraction ϕ

Frictional spheres; static states



Shear strain applied to granular materials can jam an initially stress-free state. Continued shear drives the system to the yield stress curve

- The macroscopic state diagram includes fragile, shear jammed and dynamic states at the YSC
- The initial processes leading to shear jamming generate anisotropic networks, called force chains. How should one characterize/distinguish networks?
- At a yet smaller scale, what processes enable the formation of force chains under shear?
- Do these processes lead to memory? If so, how?

***Granular Material: Dense Phases,
particularly sheared, frictional***

Forces are carried preferentially
on force chains (**Networks**)

→ multiscale

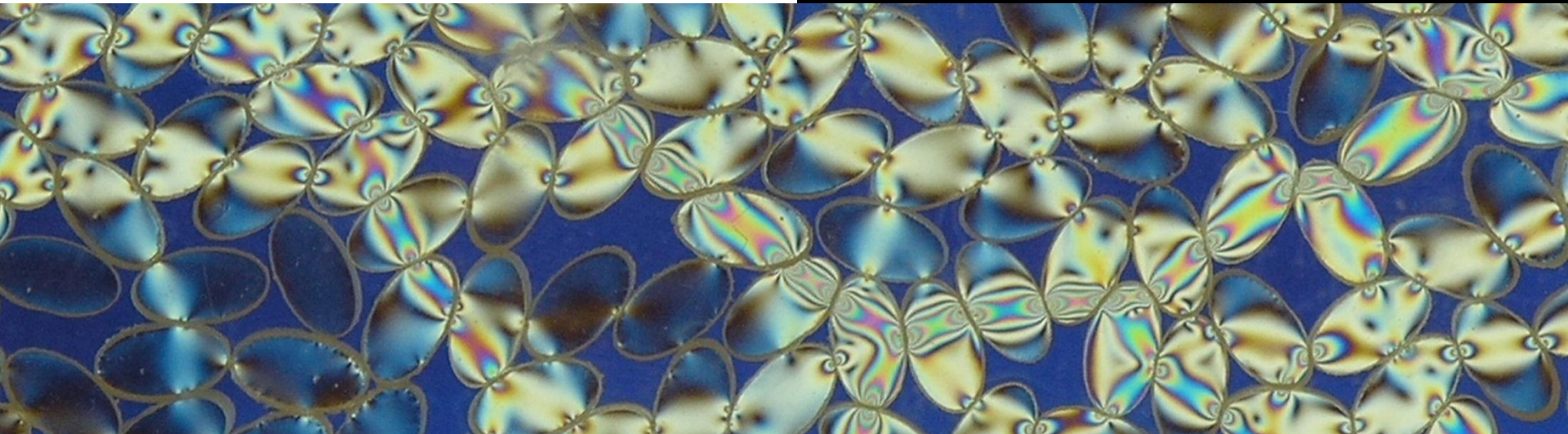
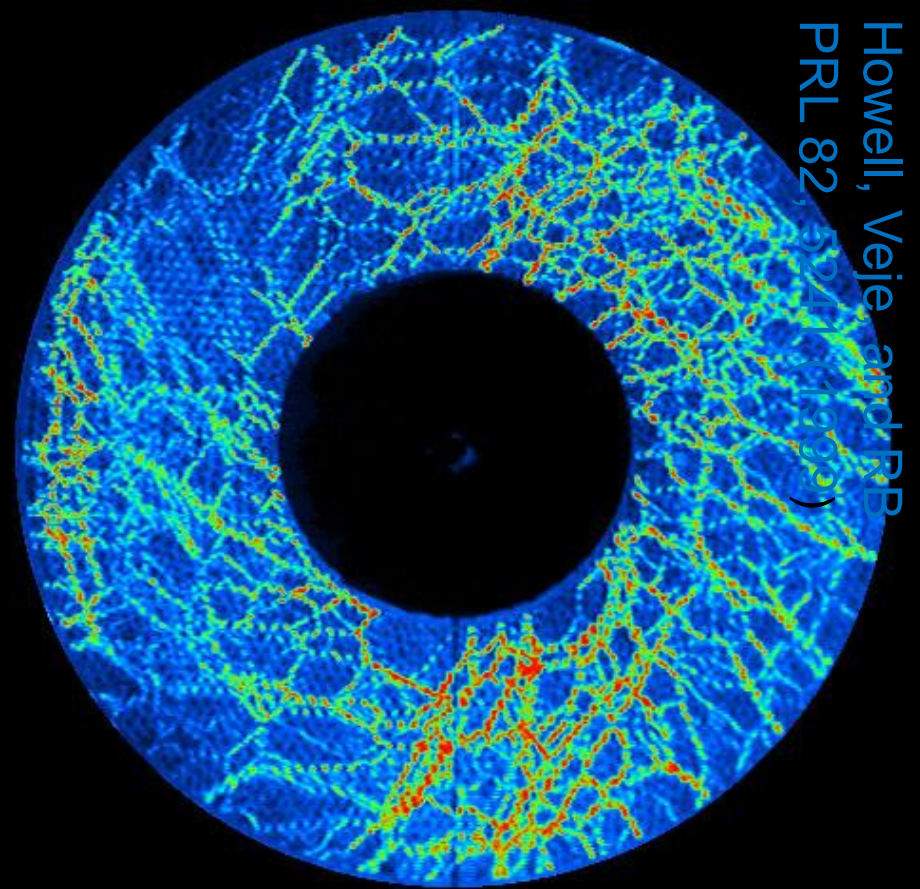
phenomena—grains to system

Deformation leads to large
spatio-temporal fluctuations

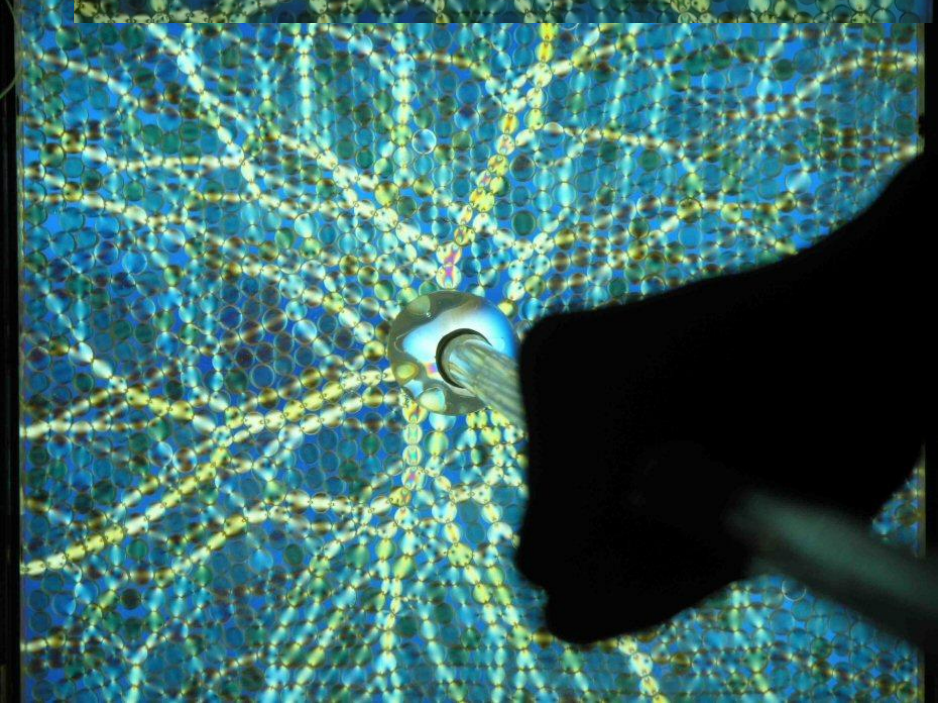
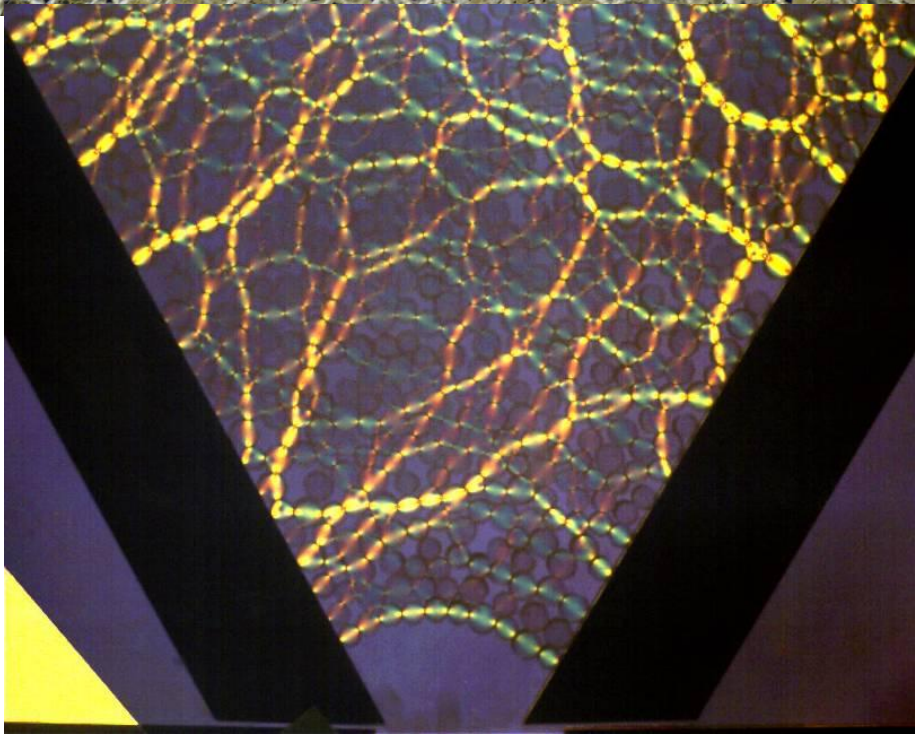
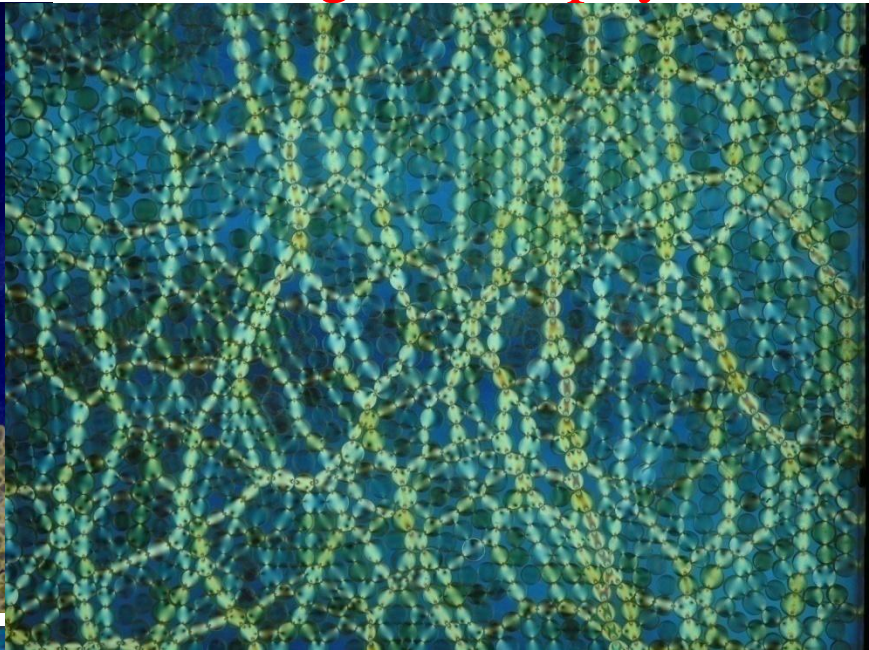
Granular materials jam

—fluid ← → solid transition

(Howell, P&G1997, PRL 1999)



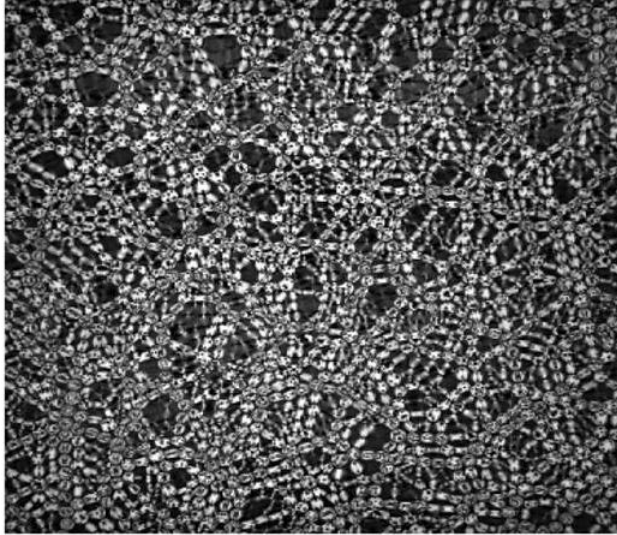
Force networks are an essential part of dense granular physics



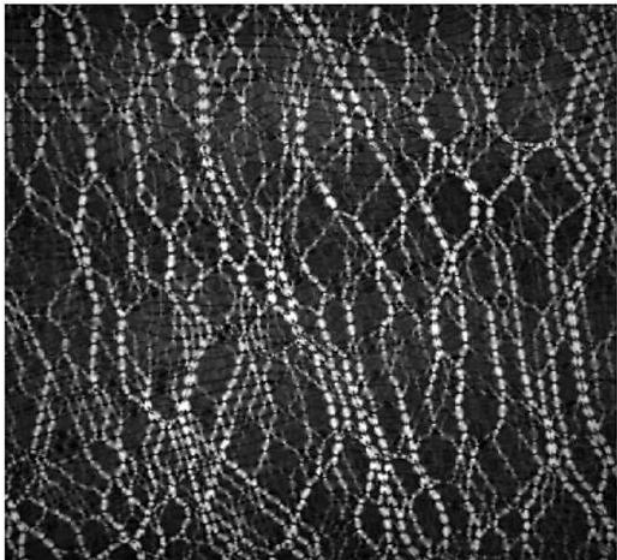
Particle properties for this discussion

- Particles interact when they are in contact—no contact no force
- Particles interact by elastic normal forces and tangential frictional forces
- Normal force, F_n depends on the distance δ by which two particles have been pushed together (overlap)— $F_n \sim \delta^\alpha \dots$
 $\alpha = 1, 3/2$ for Hookean and Hertzian contacts resp.
- Grains typically have friction, coefficient $\mu \dots$ friction forces do not depend on inter-grain positions -> no potential energy—large particle size -> athermal

Relation of force networks to protocols—e.g. compression or shear



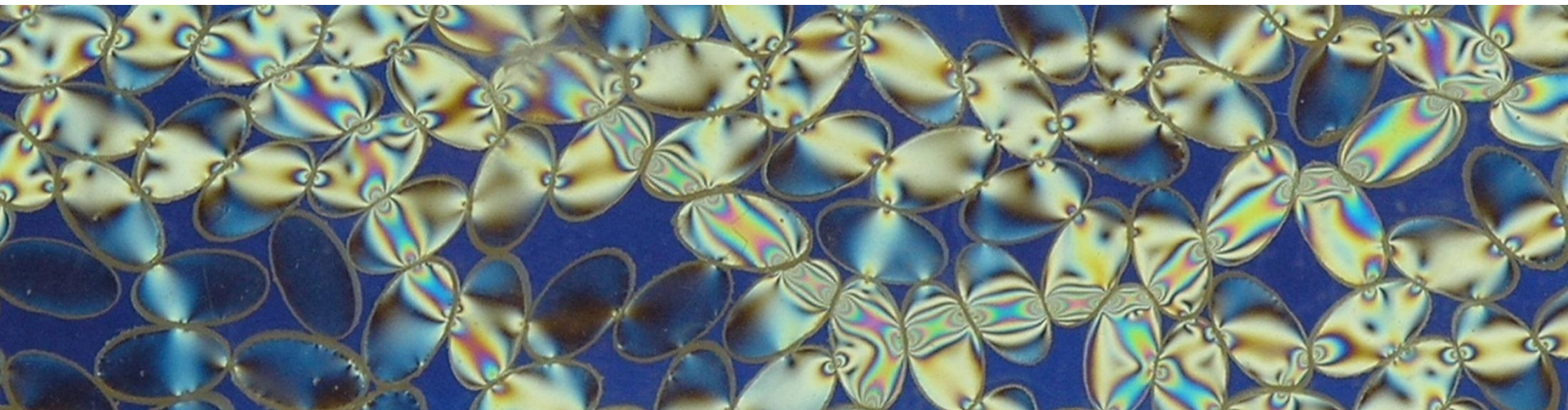
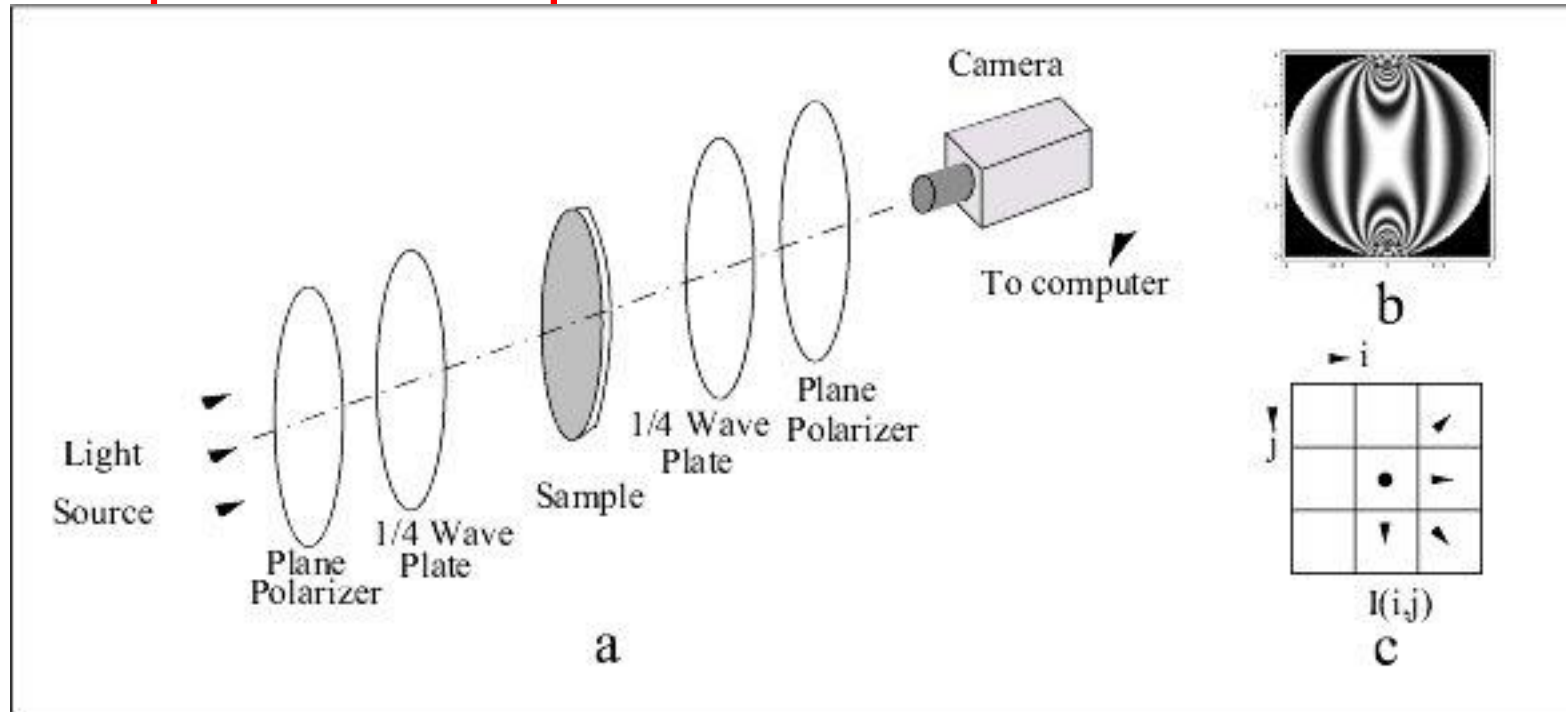
Isotropic Compression



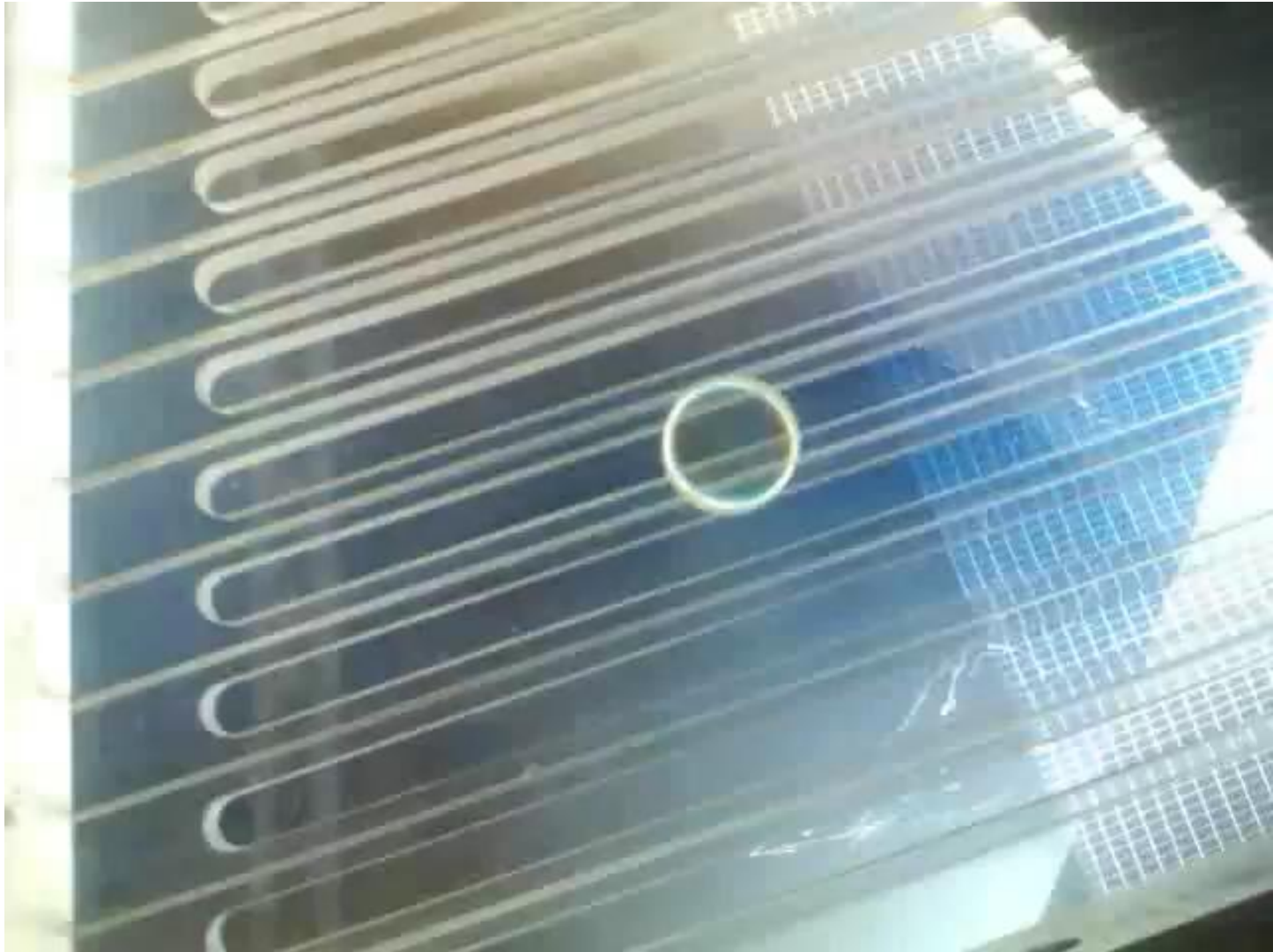
Pure Shear

T. Majmudar and BB, Nature 2005

Measuring contact forces by photoelasticity—2D quantitative experiments from smallest scales



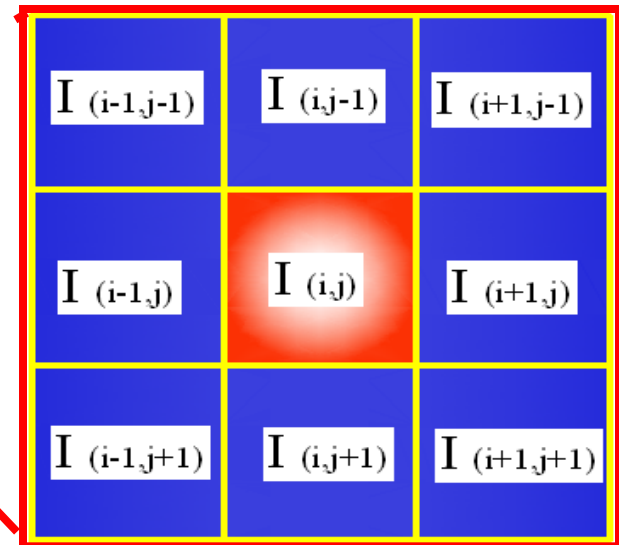
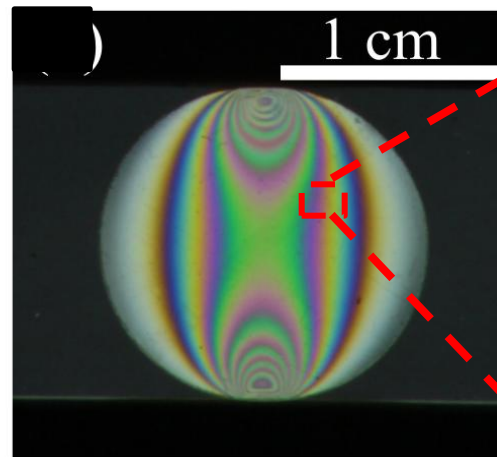
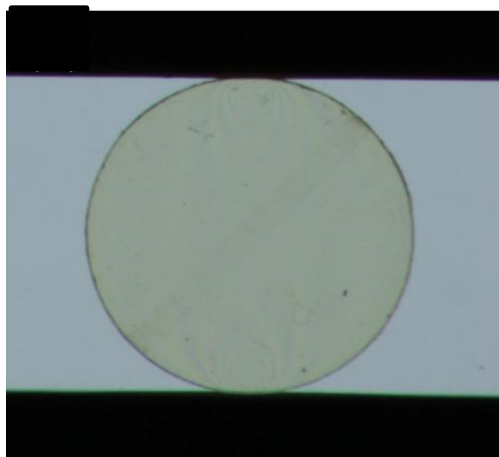
Fun with photoelasticity*



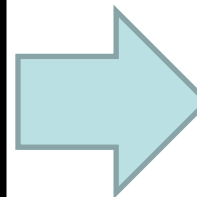
*Joshua Diksman

Experimental advances allow grain-scale force measurements--I

D. Howell, BB, PRL 1999, PRE 1999



$$\nabla I_{i,j}^2 = \frac{1}{4} \left[\left(\frac{I_{i+1,j} - I_{i-1,j}}{2} \right)^2 + \left(\frac{I_{i,j+1} - I_{i,j-1}}{2} \right)^2 + \left(\frac{I_{i+1,j+1} - I_{i-1,j-1}}{2} \right)^2 + \left(\frac{I_{i+1,j-1} - I_{i-1,j+1}}{2} \right)^2 \right]$$



$$\langle G^2 \rangle = \frac{1}{N} \sum_{i,j} \nabla I_{i,j}^2$$

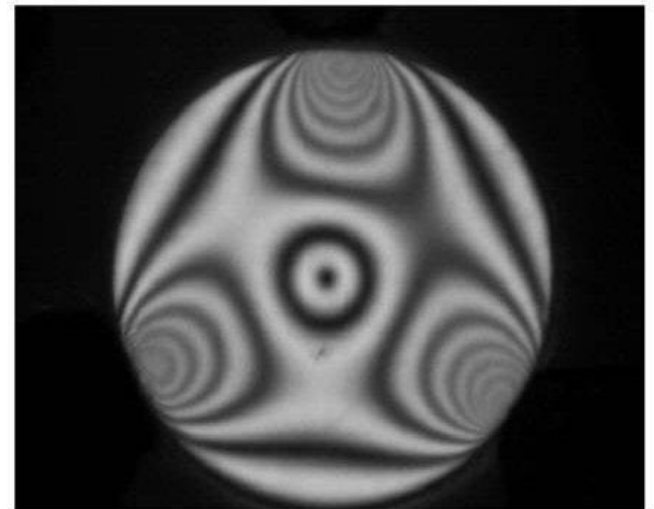
Experimental Advances allow grain-scale contact force measurements--II

T. Majmudar and BB
Nature, 2005

- Contact forces determine exact photoelastic pattern:
- Contact forces \rightarrow stresses within disk (linear elasticity)
- Planar stresses give pattern:

$$I = I_0 \sin^2[(\sigma_2 - \sigma_1)CT/\lambda]$$

c

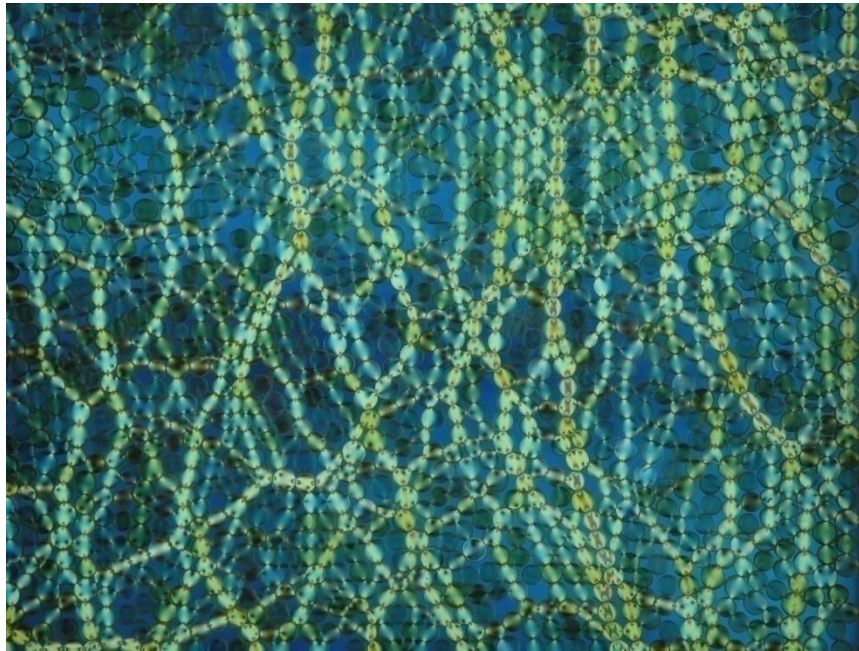


Technique for finding 2D contact forces

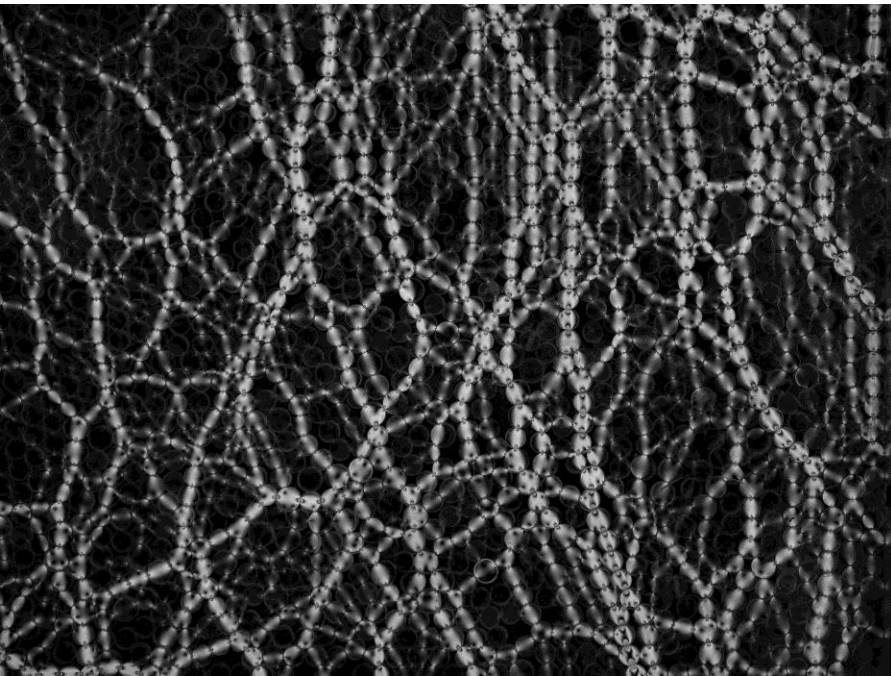
- Process images to obtain particle centers and contacts
- Exact solution for stresses (biharmonic equation) has contact forces as parameters
- Make a nonlinear fit to photoelastic pattern using contact forces as fit parameters
- $I = I_0 \sin^2[(\sigma_2 - \sigma_1)CT/\lambda]$
- In the previous step, invoke force and torque balance to reduce unknown contact forces
- Newton's 3d law provides error checking

Key new approach: obtain grain contact forces

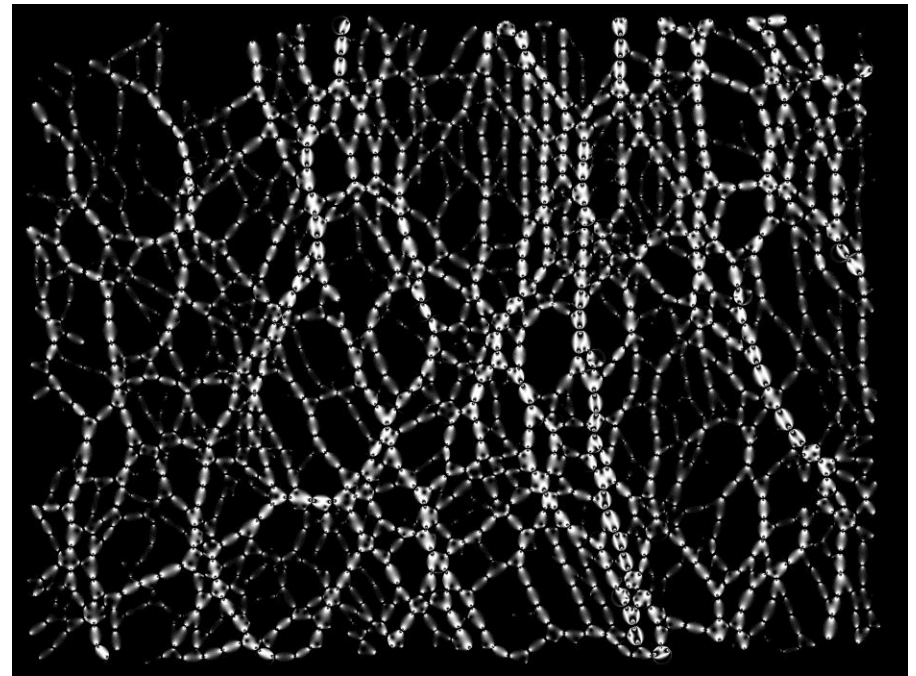
Experiment--raw



*Experiment
Color filtered*

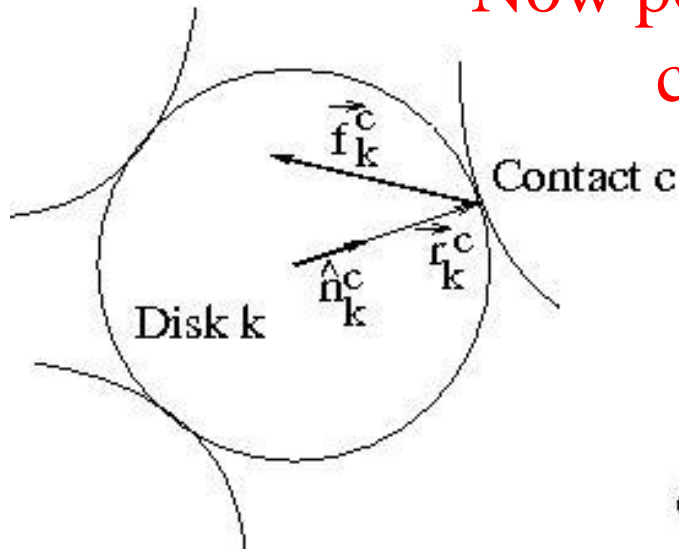


*Reconstruction
From force
inverse algorithm*



Obtaining stresses and fabric from experimental data

Now possible to obtain direct experimental characterizations at grain scale



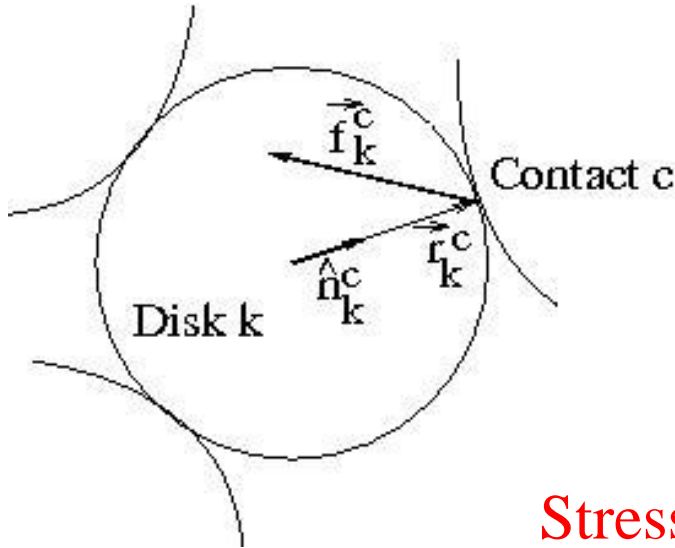
$$\hat{\sigma} = \frac{1}{V} \sum_{i \neq j} \vec{r}_{ij} \otimes \vec{f}_{ij}, \quad \text{Stress}$$

$$\hat{R} = \frac{1}{N} \sum_{i \neq j} \frac{\vec{r}_{ij}}{\|\vec{r}_{ij}\|} \otimes \frac{\vec{r}_{ij}}{\|\vec{r}_{ij}\|}, \quad \text{Fabric}$$

These quantities can be coarse-grained to produce continuum fields

Stresses, fabric, force moment tensor—2D

evaluate across scales: particles, networks, system



Fabric tensor

$$R_{ij} = \sum_{k,c} n_{ik}^c n_{jk}^c$$

$$Z = \text{trace}[R]$$

Stress tensor, force moment tensor

$$\text{stress: } \sigma_{ij} = (1/A) \sum_{k,c} r_{ik}^c f_{jk}^c$$

$$\text{Force moment } \Sigma_{ij} = \sum_{k,c} r_{ik}^c f_{jk}^c = A \sigma_{ij}$$

A is particle/system area

Pressure, P and shear stress

$$P = \text{Tr}(\sigma)/2 = (\sigma_2 + \sigma_1)/2$$

$$:\tau = (\sigma_2 - \sigma_1)/2$$

Displacements and rotations of grains

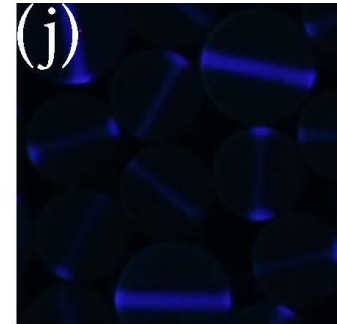
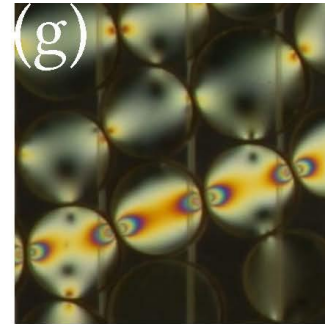
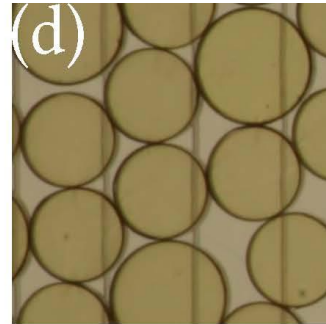
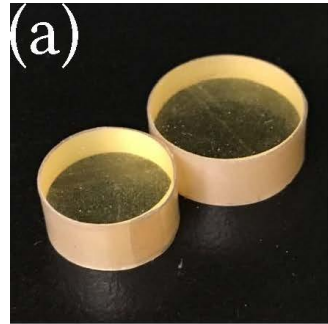
What about rotation?



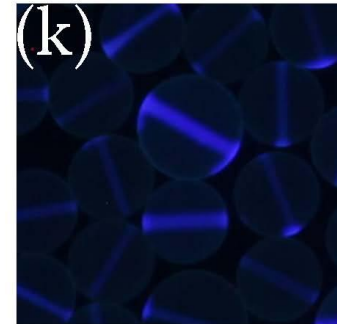
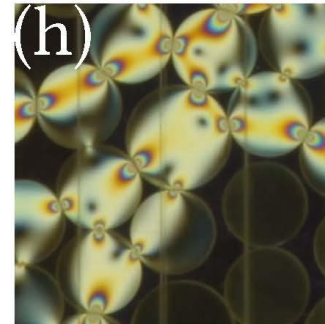
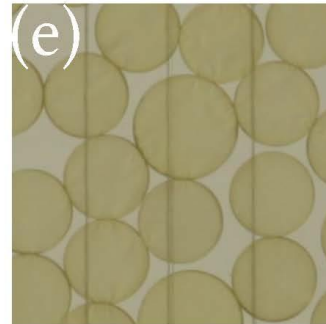
Track Particle: Forces/Displacements/Rotations

Following a small strain step we track particle displacements

$$\mu = 0.15$$

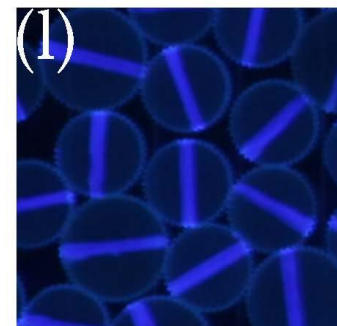
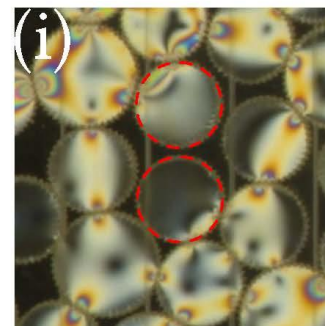
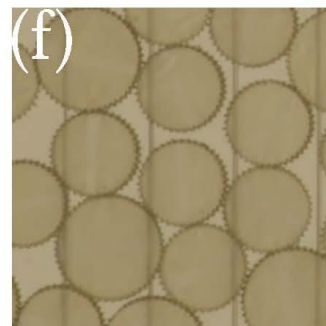
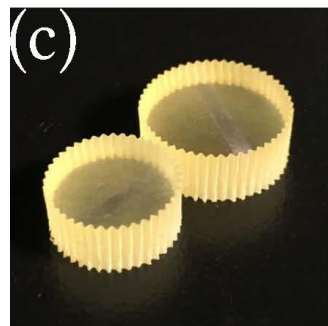


$$\mu = 0.65$$



$$\mu \gg 1$$

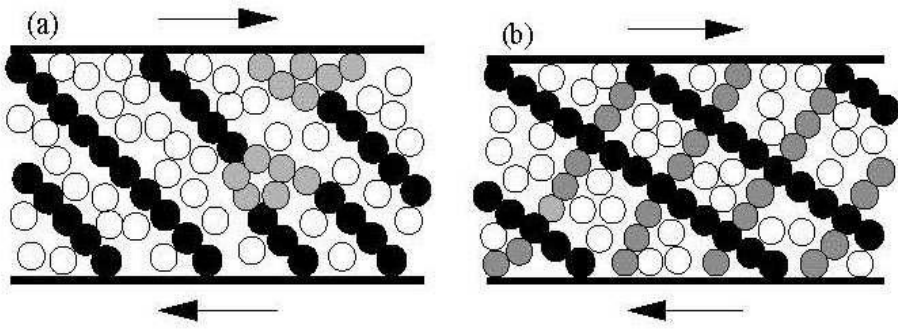
Under UV light bars
Allow rotational tracking



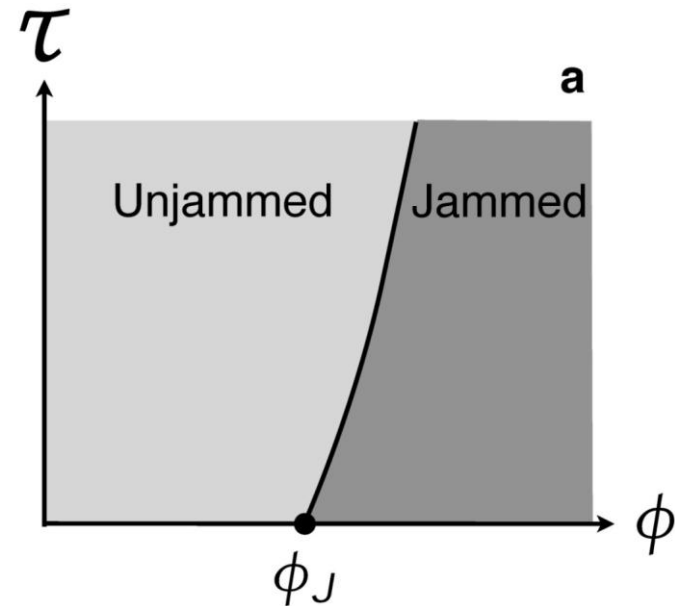
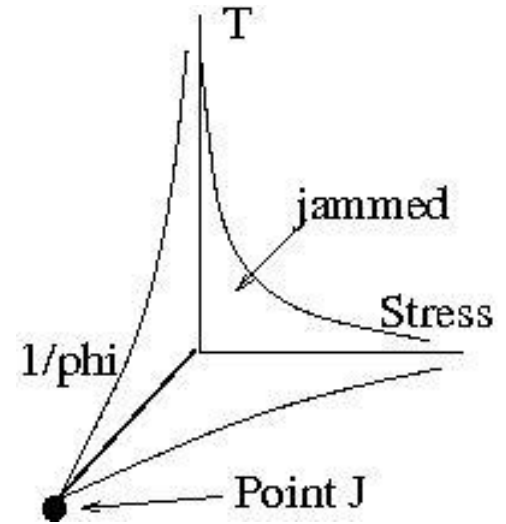
Majmudar and BB Nature, 2005; Majmudar et al. PRL 2007; Zhang et al. Gran.Matt2010; Bi, Zhang, Chacraborty, BB, Nature 2011, Ren et al. PRL 2013, Zheng et al. EPL 2014; Clark et al. PRL 2015; Cox et al. EPL 2016, Barés et al. PRE 2017, Wang et al. 2018

Context: Jamming and Fragility— sheared granular materials

Fragile states: ability to resist strain:
Strong in one direction but weak in reverse



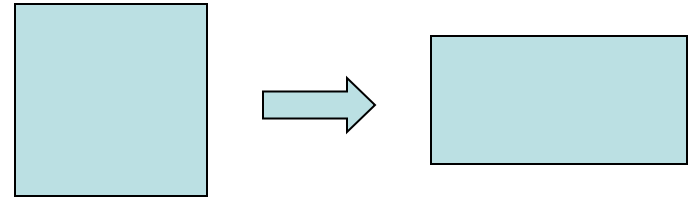
Cates et al. PRL 1998



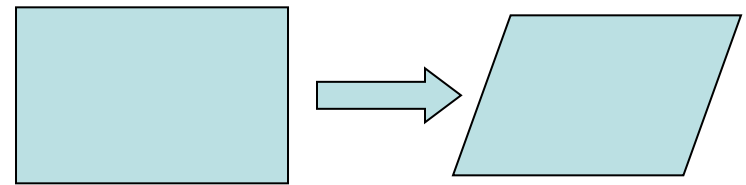
After Liu and Nagel, Nature, 1998, O'Hern et al. PRE 2003

Investigate the response to shear—creation of **stable** anisotropic states

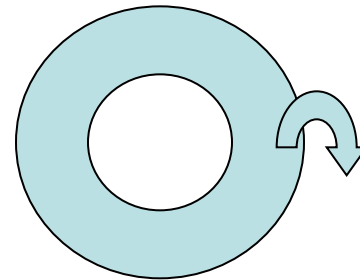
- Example 1: pure shear



- Example 2: simple shear

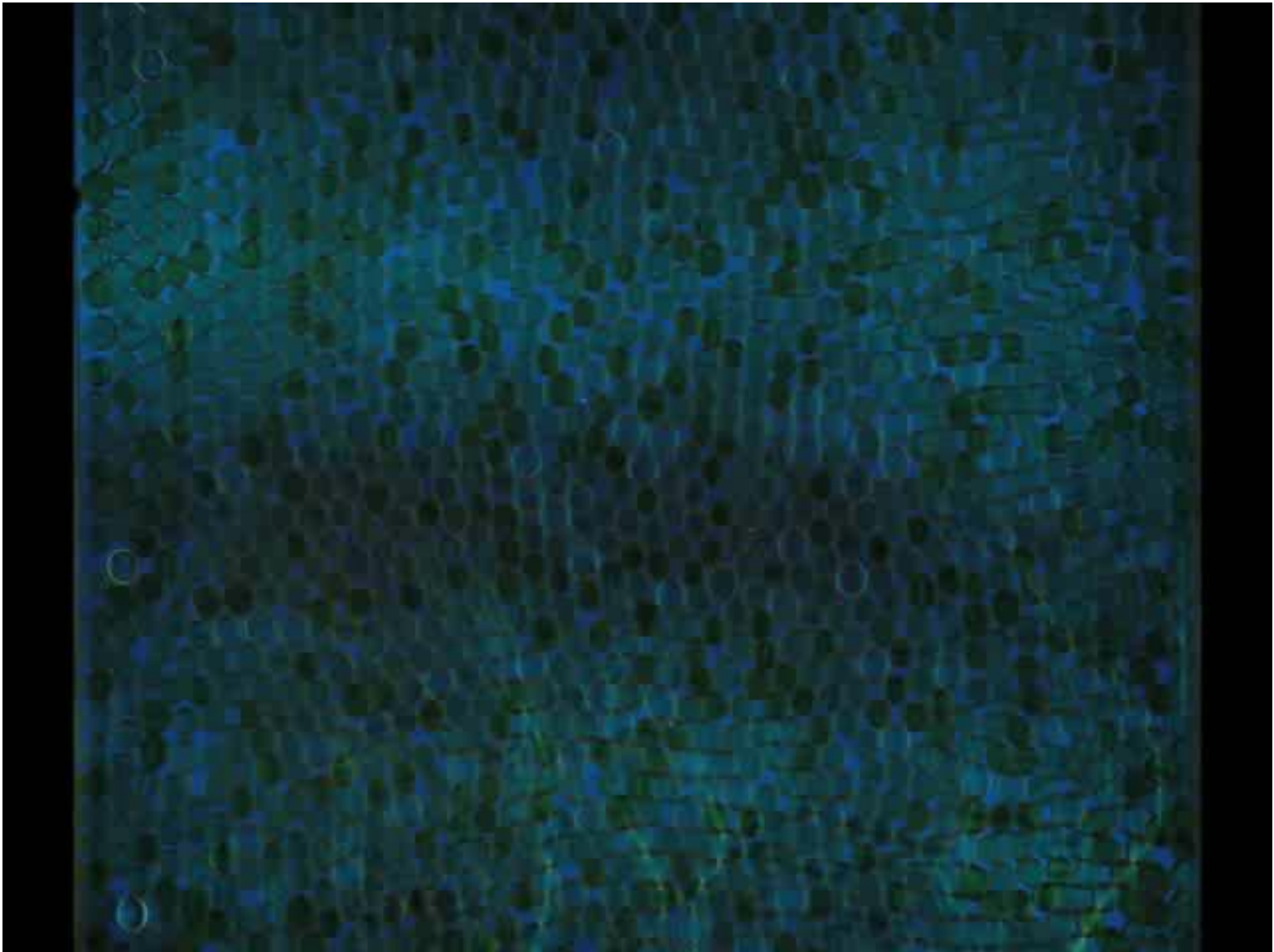


- Example 3: Couette shear

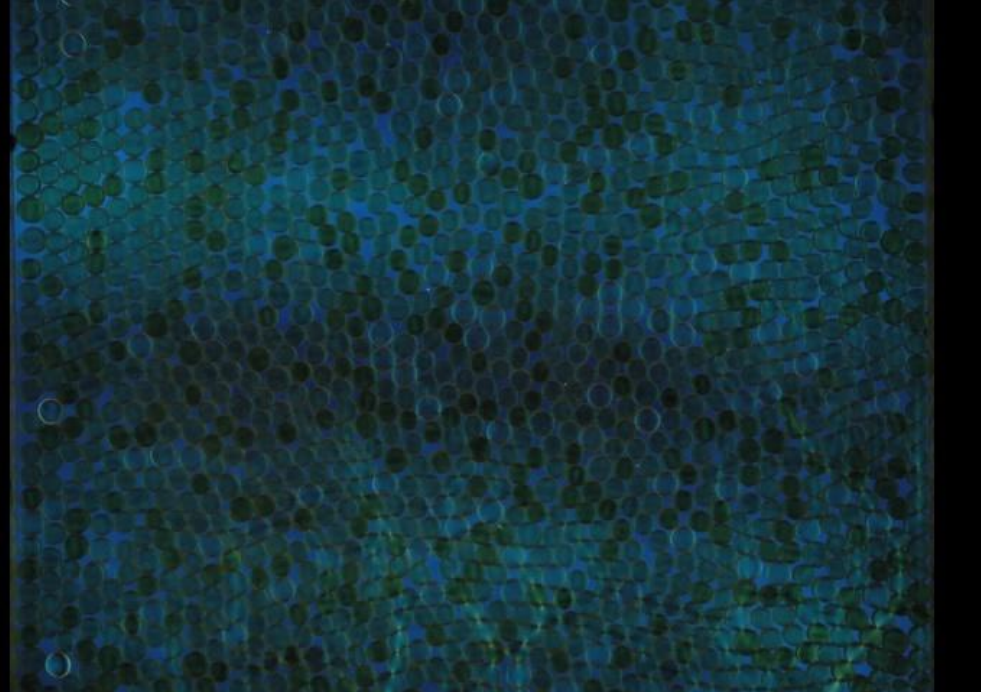


Series of experiments to map out phase diagram

Time-lapse video (one shear cycle) shows force network evolution—**Frictional Shear Jamming**—



Bi, Zhang, Chakraborty, RPB, Nature, 2011

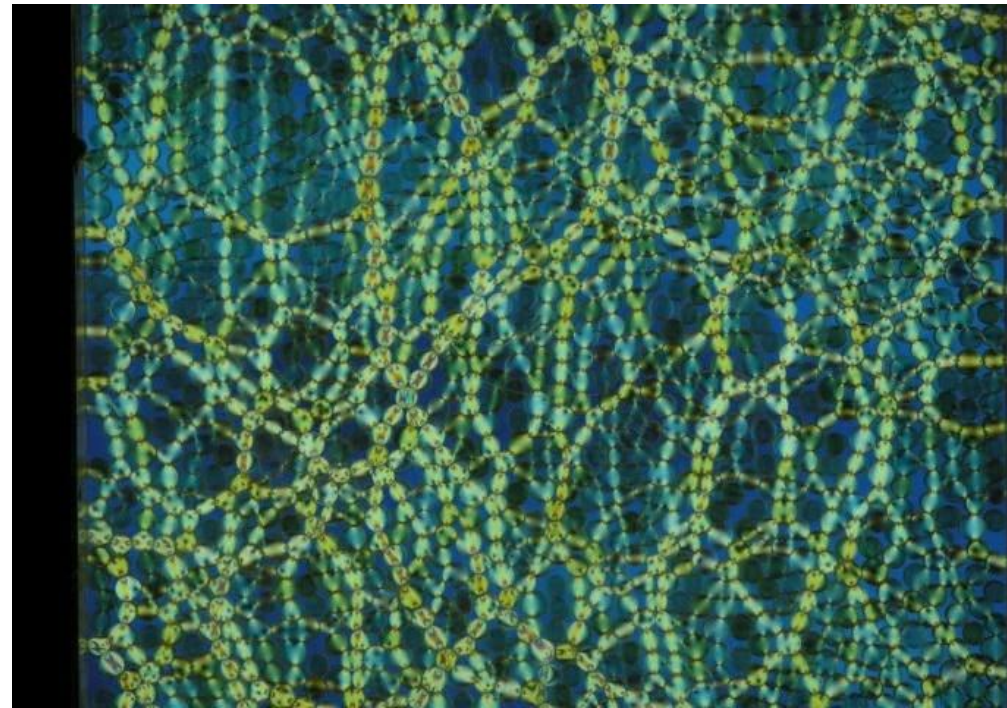


Initial and final states
following a shear cycle—
no change in area—
Density cannot distinguish
--but networks can

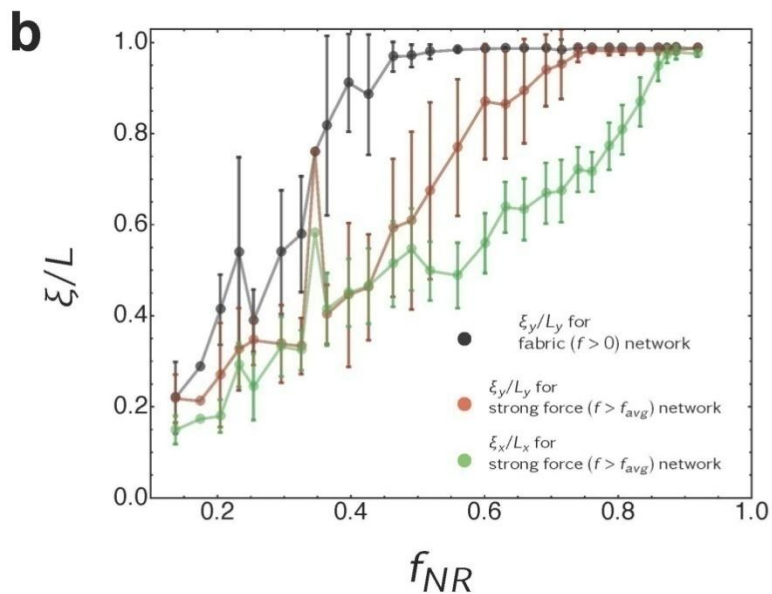
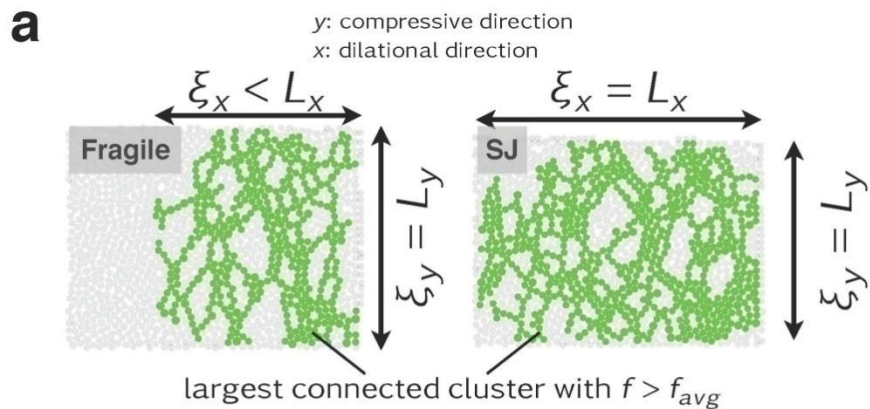
← Initial state, isotropic,
no stress

Works between $\varphi_S < \varphi < \varphi_J$

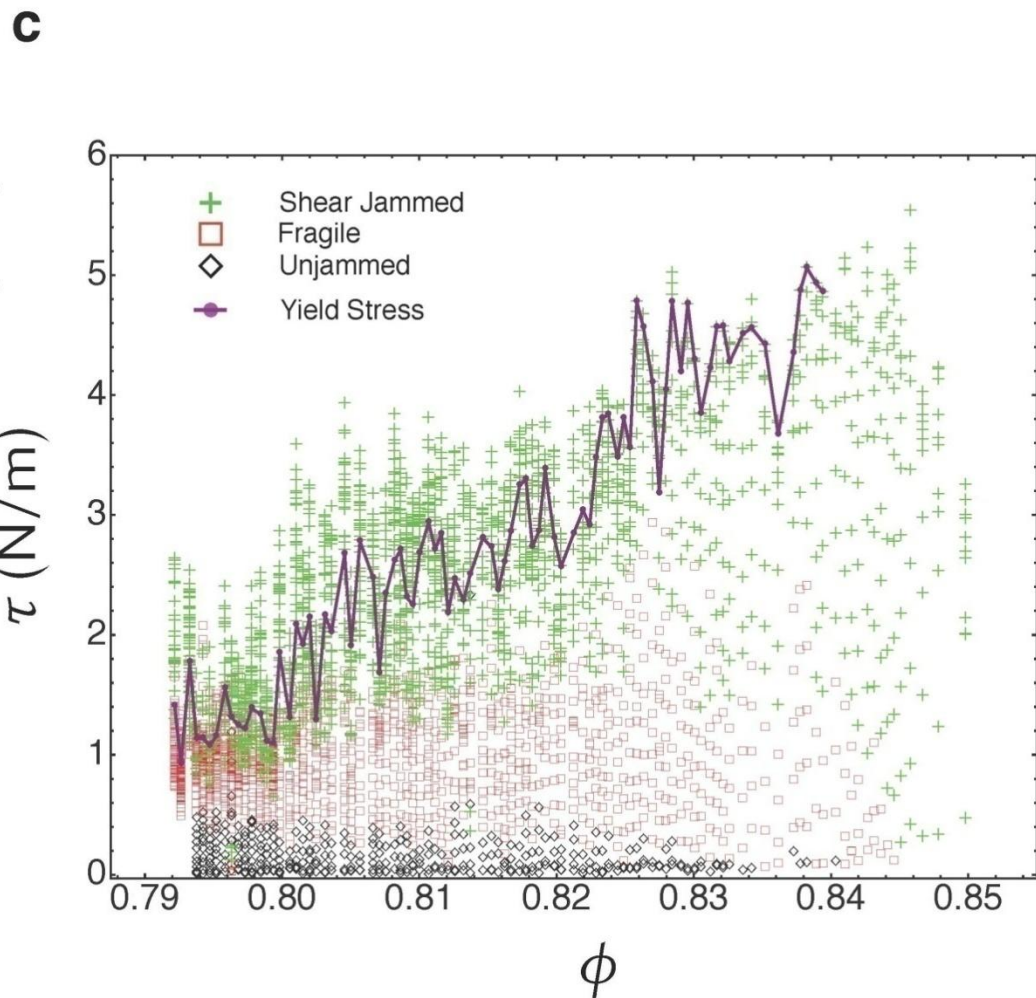
Final state →
large stresses
jammed



Some special properties of shear jammed states—start with Directional Percolation, Fragile and Shear-Jammed States (Bi et al. Nature, 2011)

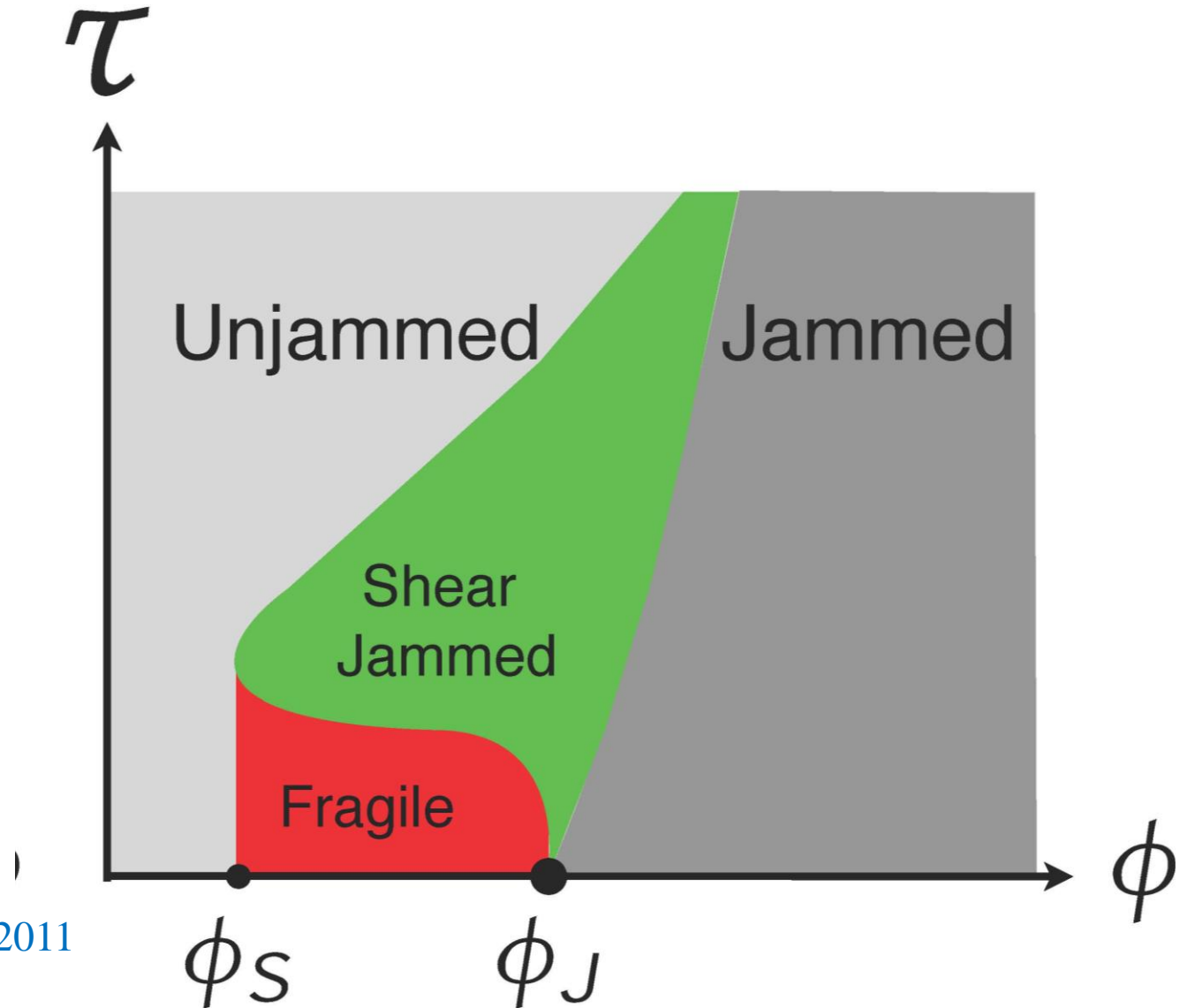


f_{NR} = nonrattler fraction

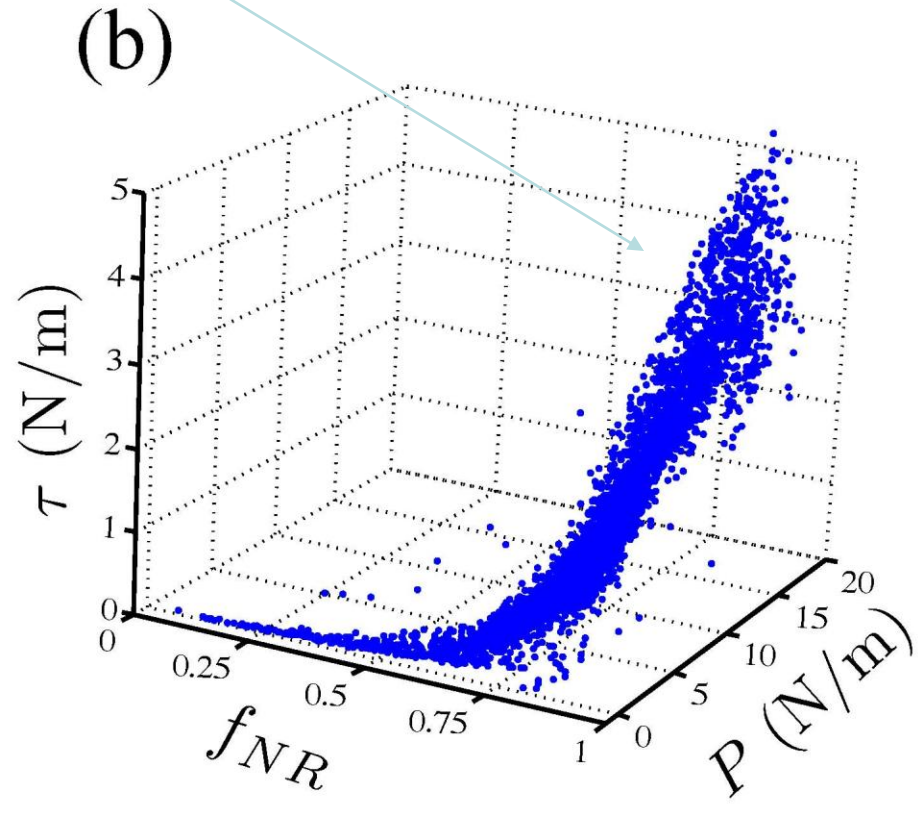
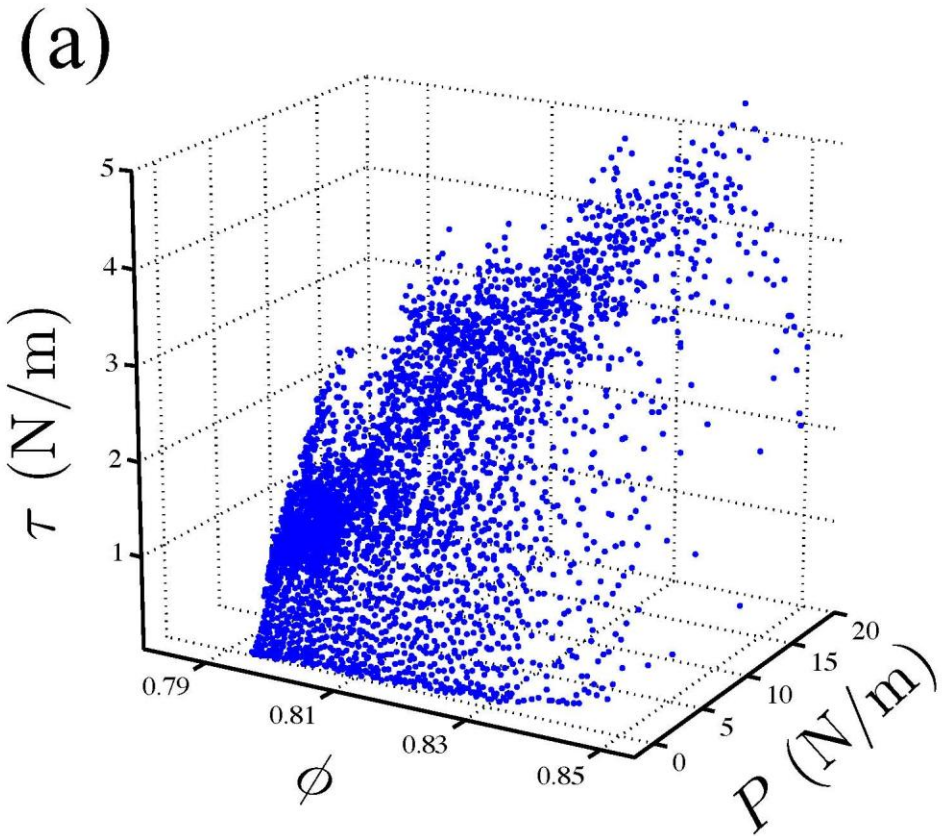


See Otsuki and Hayakawa, Phys. Rev. E **83**, 051301 (2011)

Jamming diagram for frictional grains



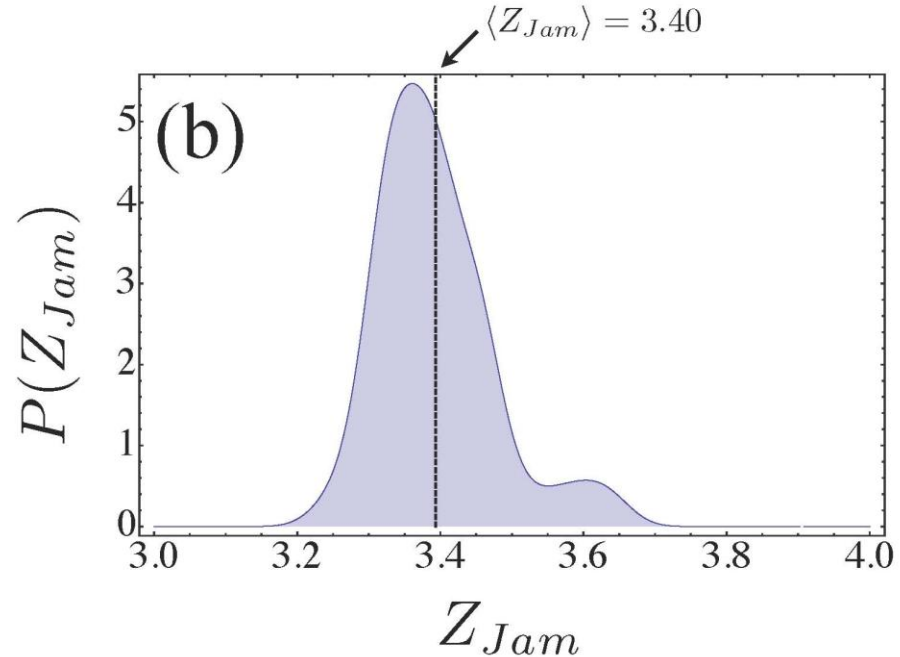
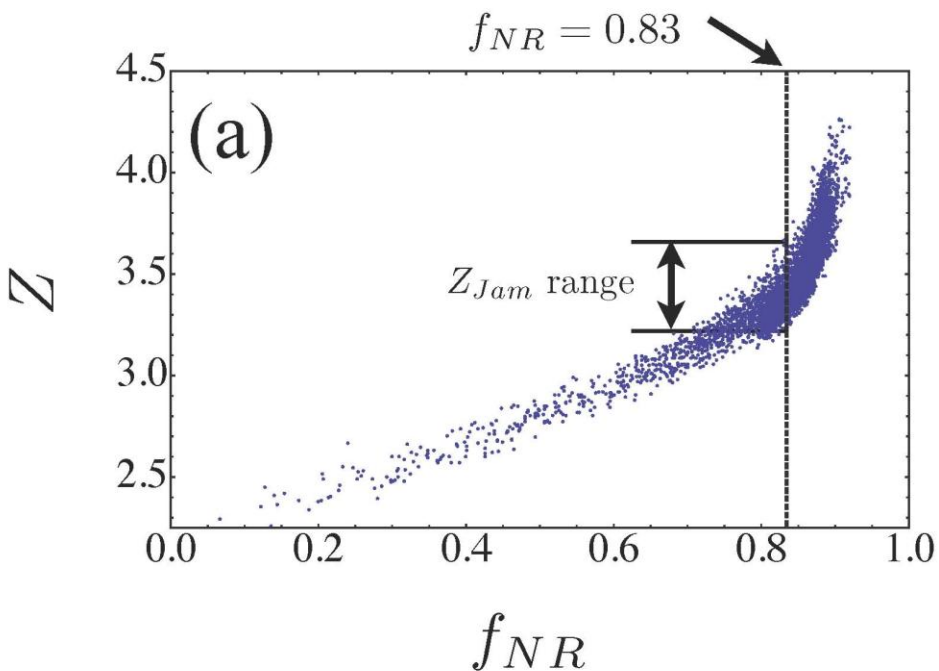
Other features of shear jamming
Stresses vs. non-rattler fraction f_{NR}
Good collapse of ‘classical measures’



f_{NR} = fraction of non-rattlers—a rattler has too few contacts to be mechanically stable

Ditto for contact network properties, e.g. Z

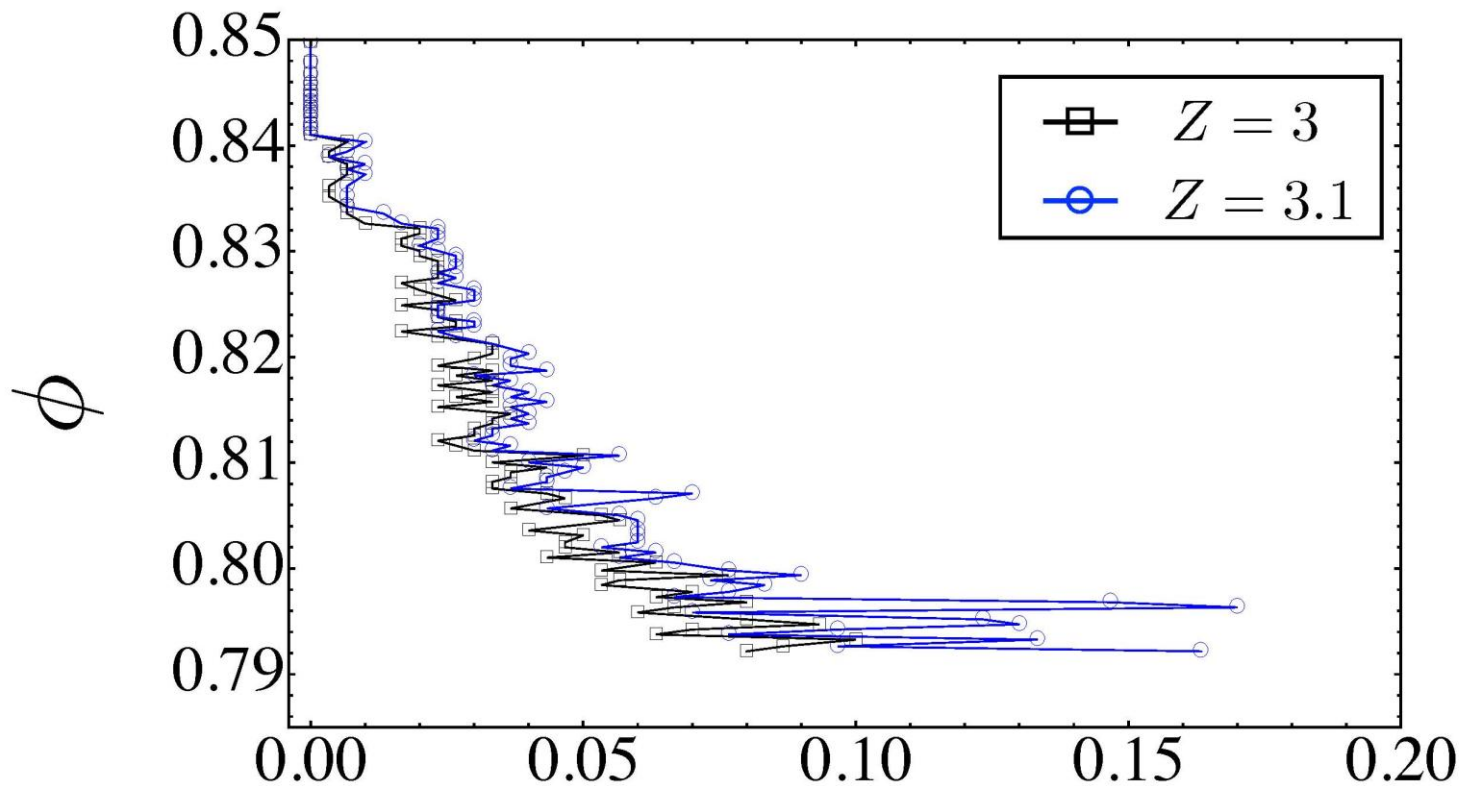
Z is average number of contacts per particle



f_{NR} = fraction of non-rattler particles
non-rattlers need at least 2 contact

Range of densities for which shear jamming can be achieved

Random dense

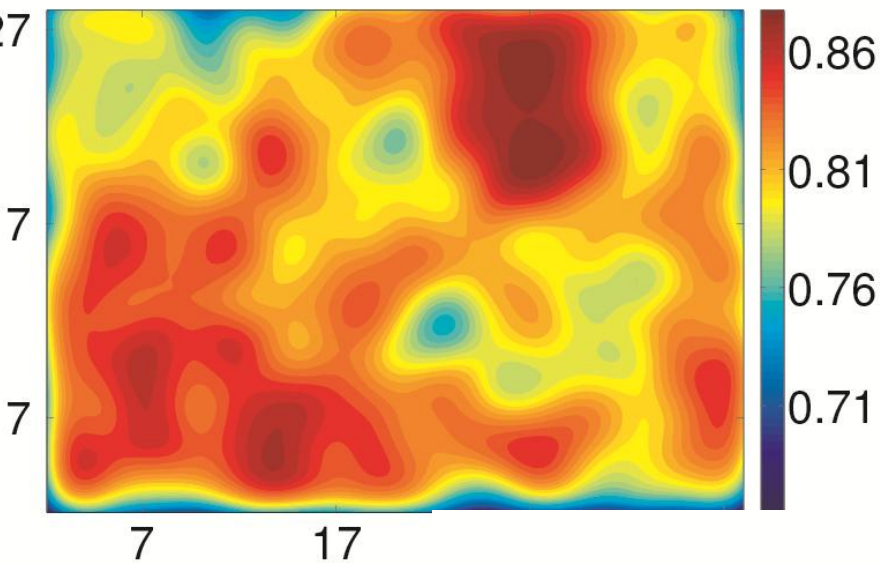


$$\gamma_J(\phi) = \min\{\gamma(Z \geq Z_{iso}^\infty; \phi)\}$$

Minimum strain to shear jam

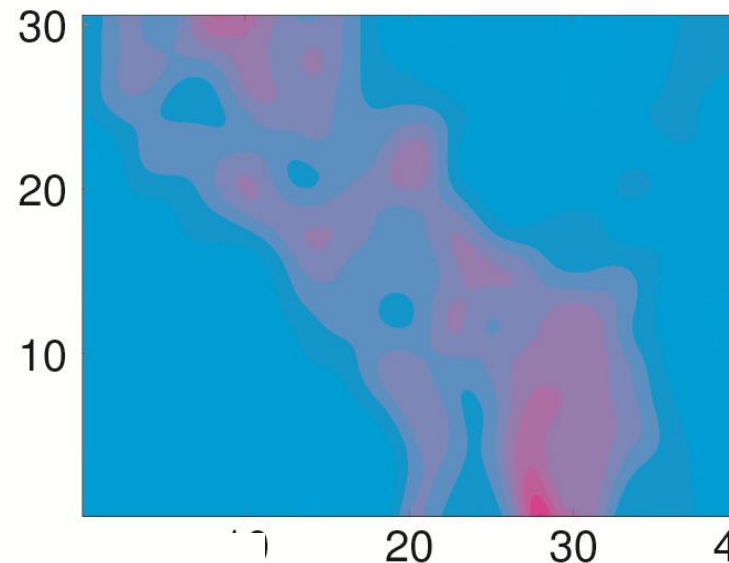
Shear band forms: result of driving soft system from wall, base friction

Contour plots of coarse-grained local density and strain components,
at a strain of $\gamma=9.3\%$



density

ϵ_{xx}

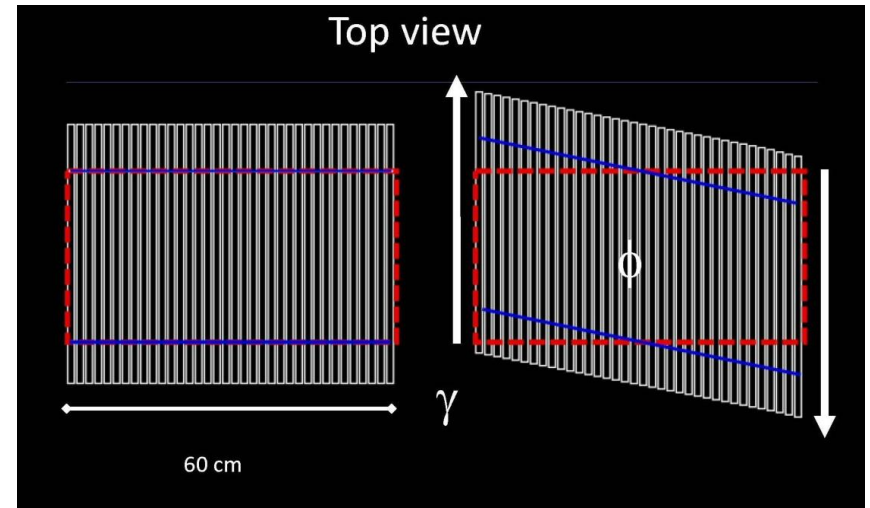


ϵ_{yy}

Jie Zhang,
I.Goldhirsch
BB, Supp.Prog.
Theor.Phys2010

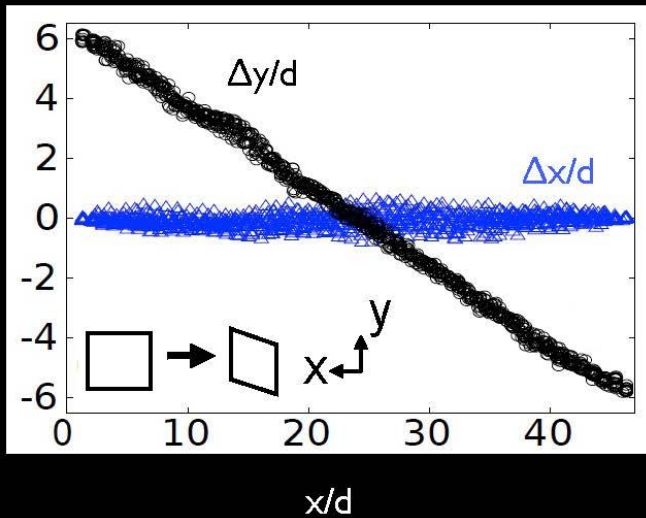
2nd apparatus: uniform simple shear throughout system

Joshua Dijksman, Jie Ren, Dong Wang
BB, PRL 2013



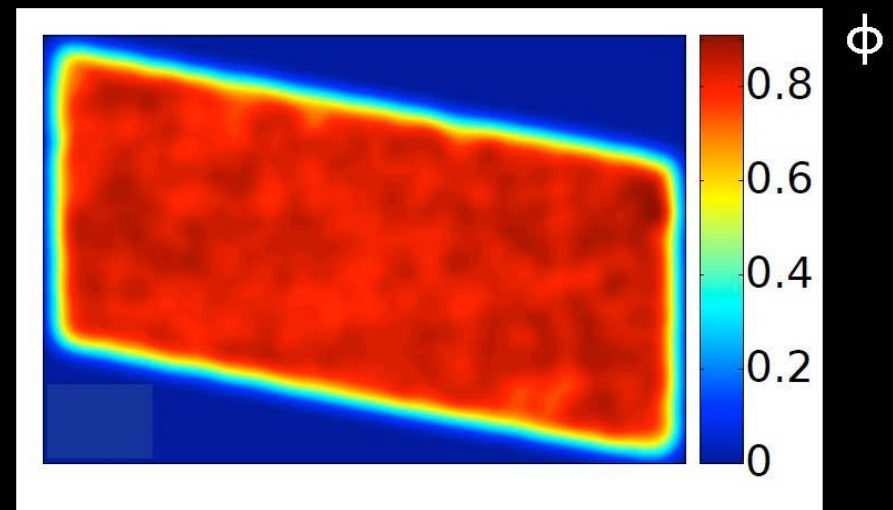
This new experimental approach supplies uniform shear—max strain $\sim \gamma = 0.5$

Particle displacements after shear

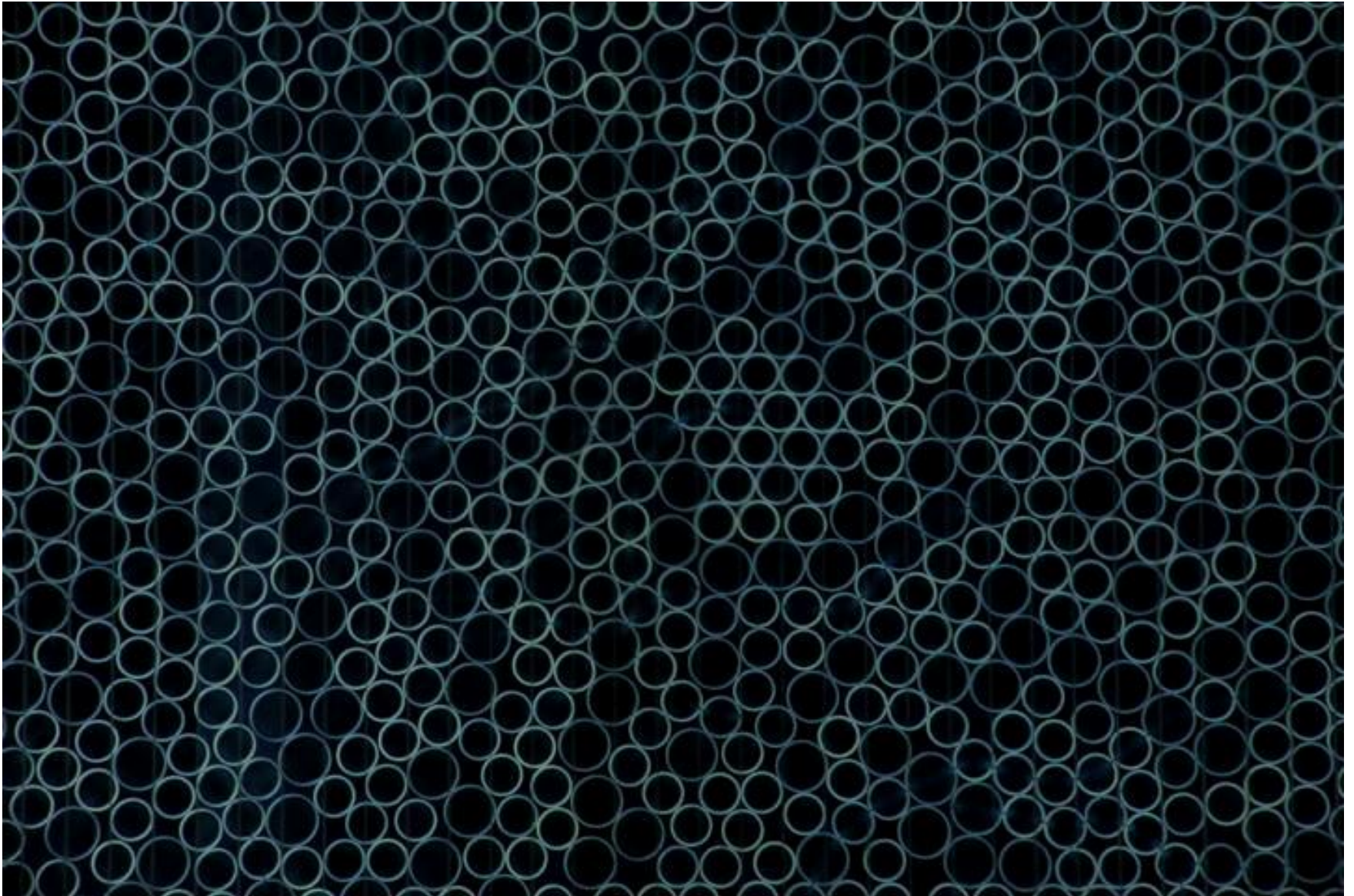


Bottom slats suppress inhomogeneities

Local packing fraction fluctuations are random



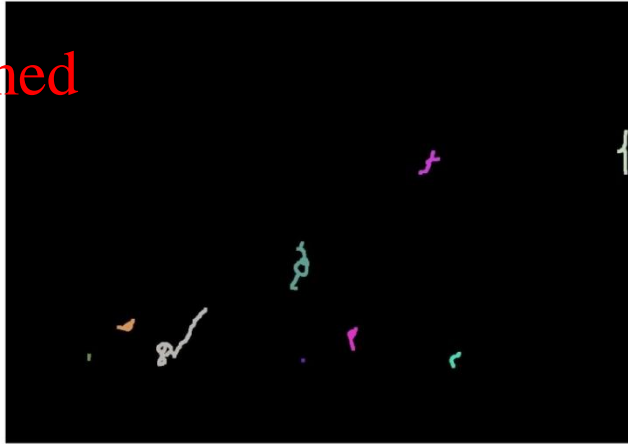
Shear-Jamming—clean experiment, constant ϕ —states well characterized



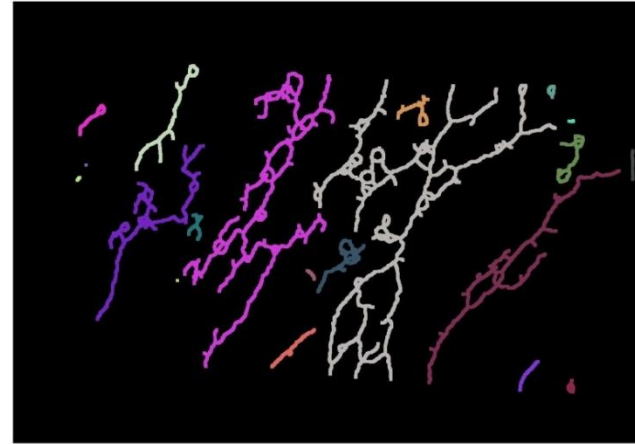
Networks are key to shear jamming

Increasing shear strain—first unidirectional, then all-directional percolation of strong force network (e.g. Cates et al. PRL 1998)

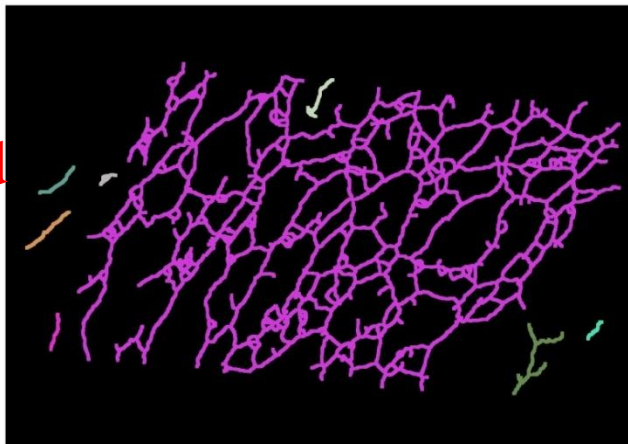
The force chains look differently at different stages of linear shear:



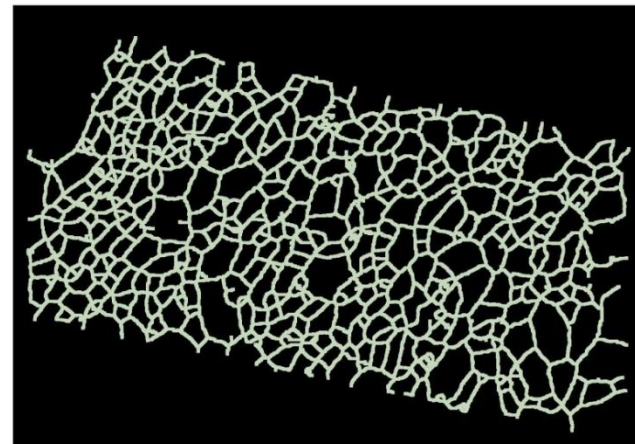
1. minimal force, unjammed



2. more force, multiple clusters; fragile



3. percolating cluster, onset of jamming



4. one large cluster, jammed

Unjammed
not
fragile

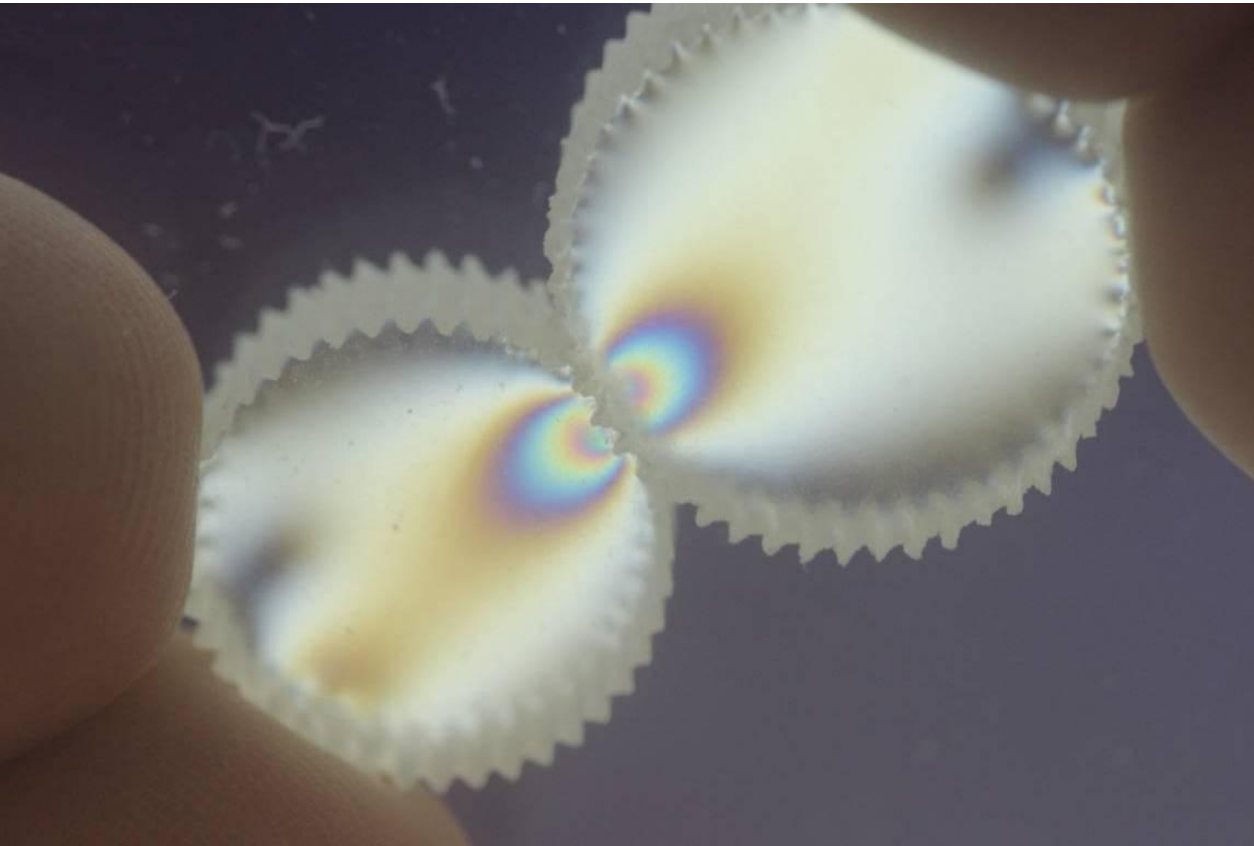
Fragile

Shear
Jammed

Evolves
towards
more
isotropic

Changing friction: higher (lower) μ gives lower (higher) ϕ_s

$\mu \gg 1$

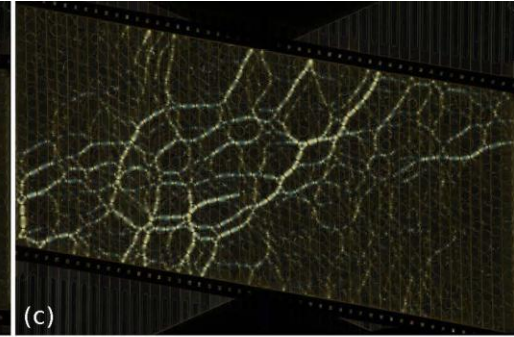
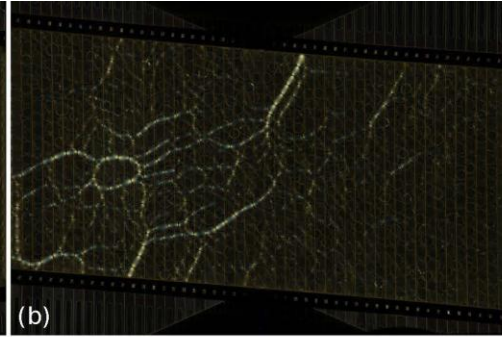
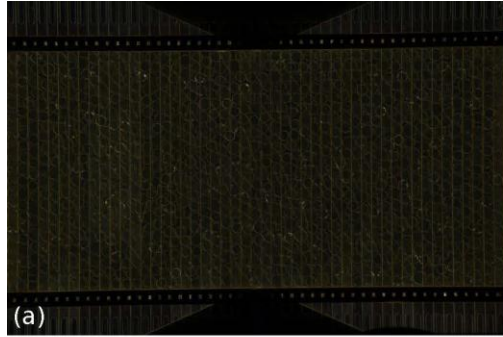


Make gear particles
with very high μ

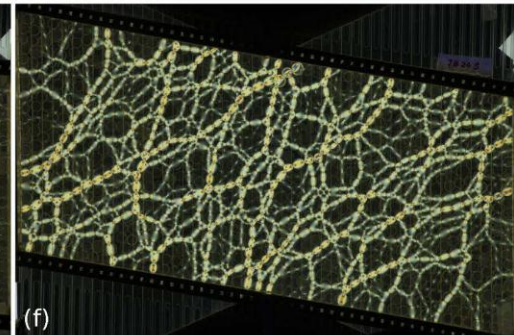
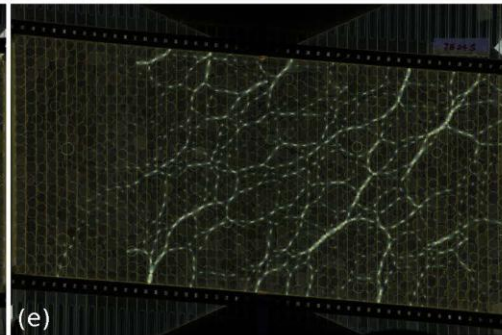
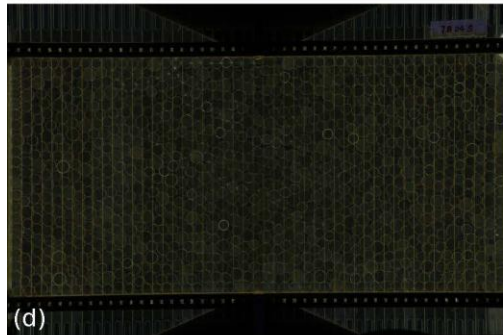
Wrap particles with Teflon for low μ

Effect of friction (Dong Wang, Jie Ren, Jonathan Barés, BB)

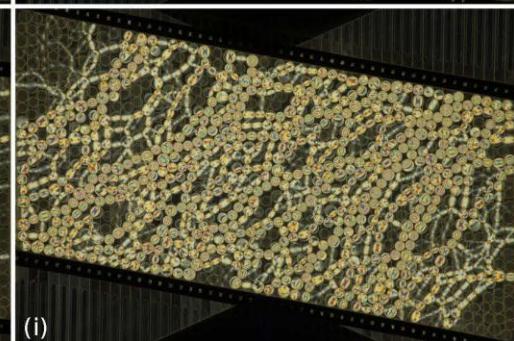
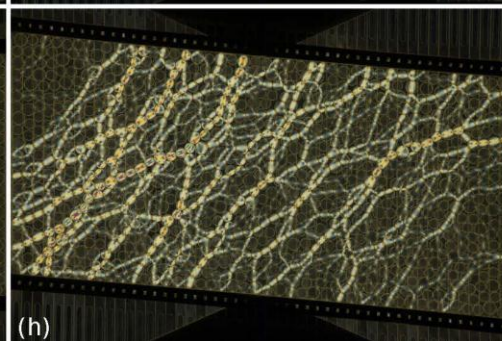
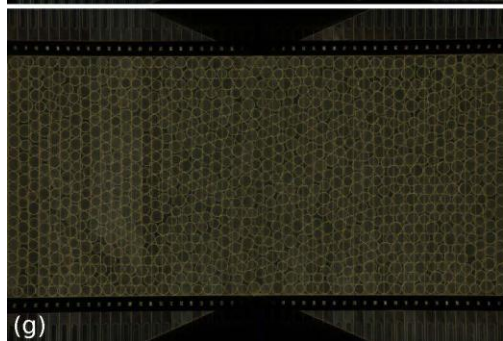
$\mu = 0.15$



$\mu = 0.65$

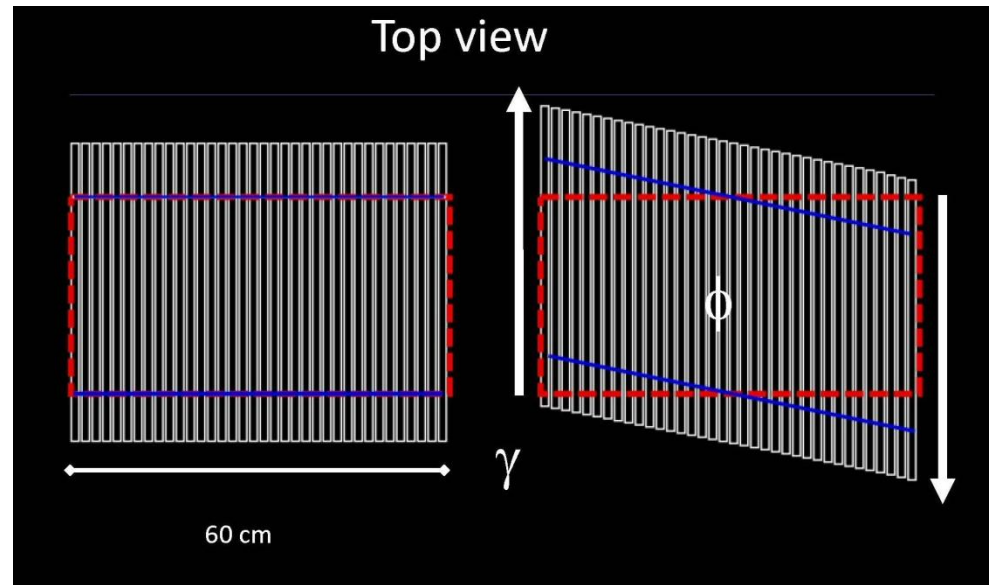


$\mu \gg 1$



Increasing strain, $\gamma \rightarrow$

Does a GM have memory under cyclic shear?

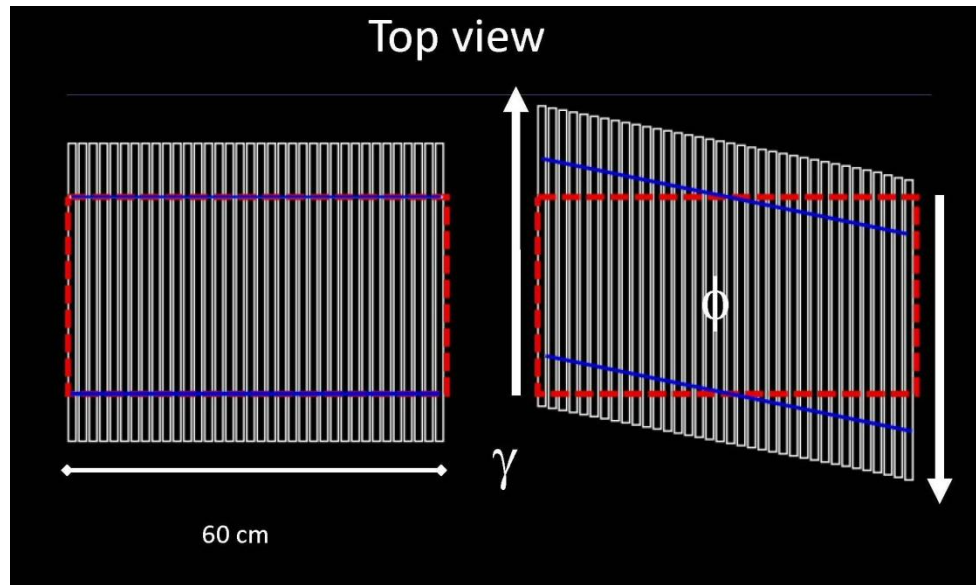


(Joshua Dijksman, Jie Ren, Dong Wang
RPB, Phys. Rev. Lett. 2013)

Use simple shear experiment, no shear bands

Dense materials—compare to Corté et al. Nat. Phys. (2008)
Fiocco et al. PRL (2014); Royer and Chaikin, PNAS (2015)

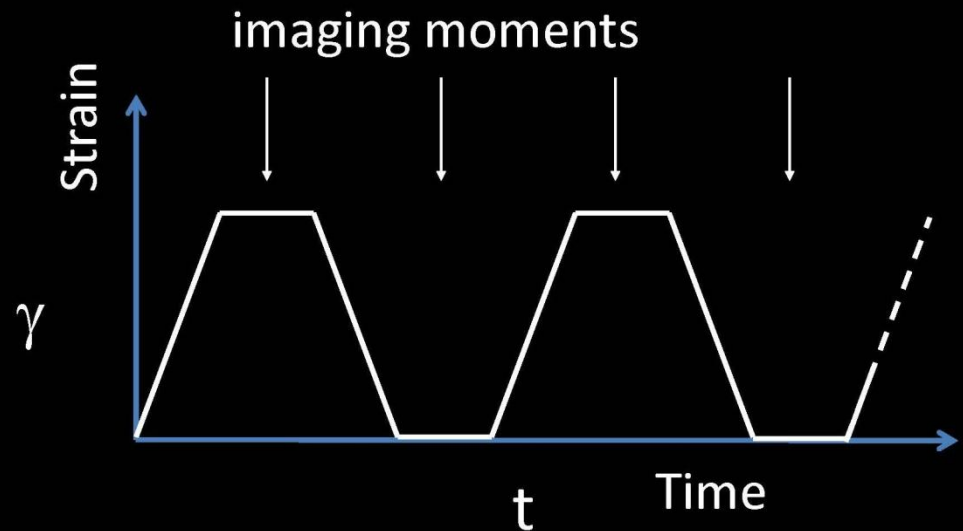
Memory forms and evolves under cyclic shear



Granular analogue of dense suspension experiment

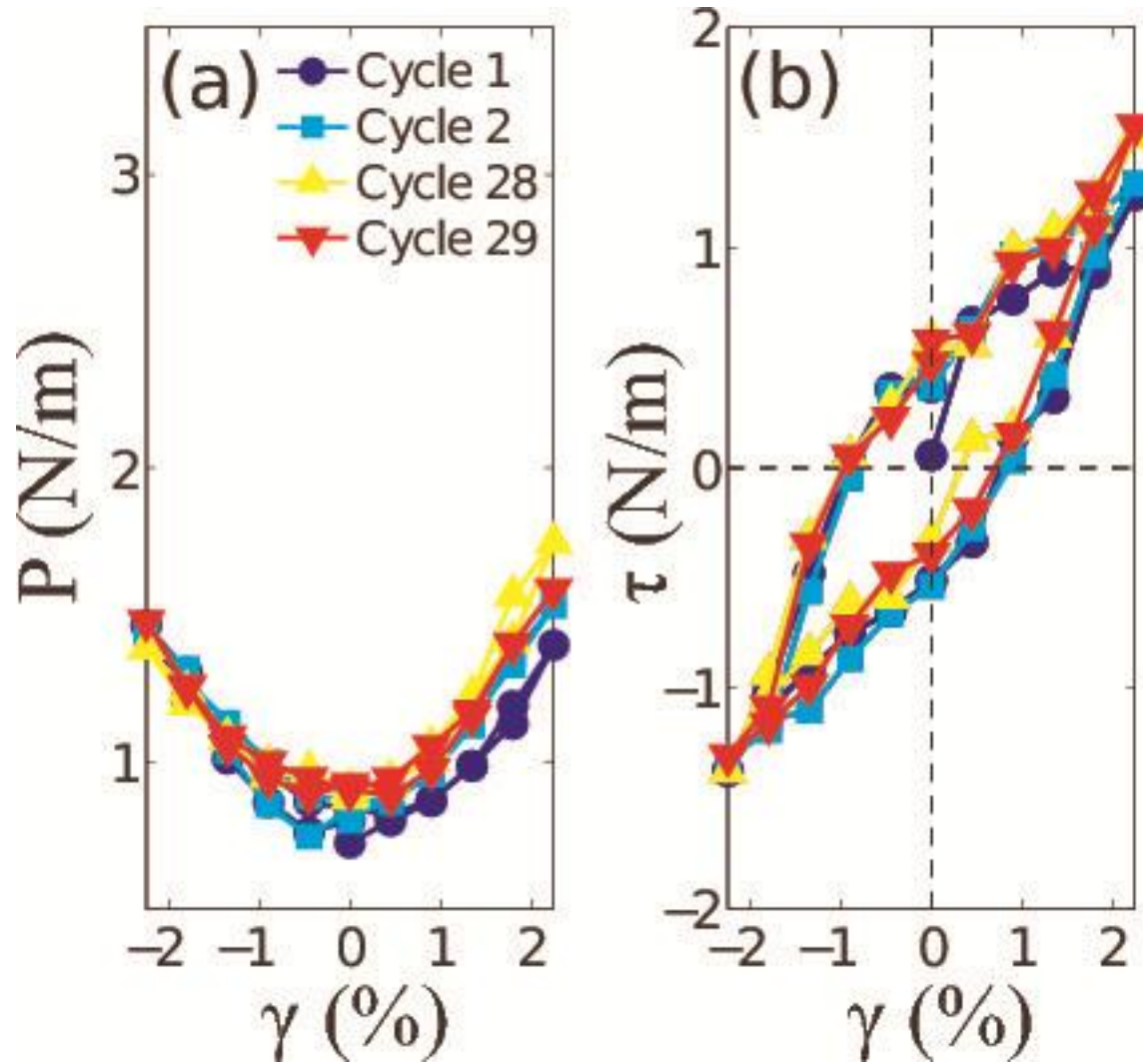
Example below is asymmetric shear

Also: symmetric cyclic shear



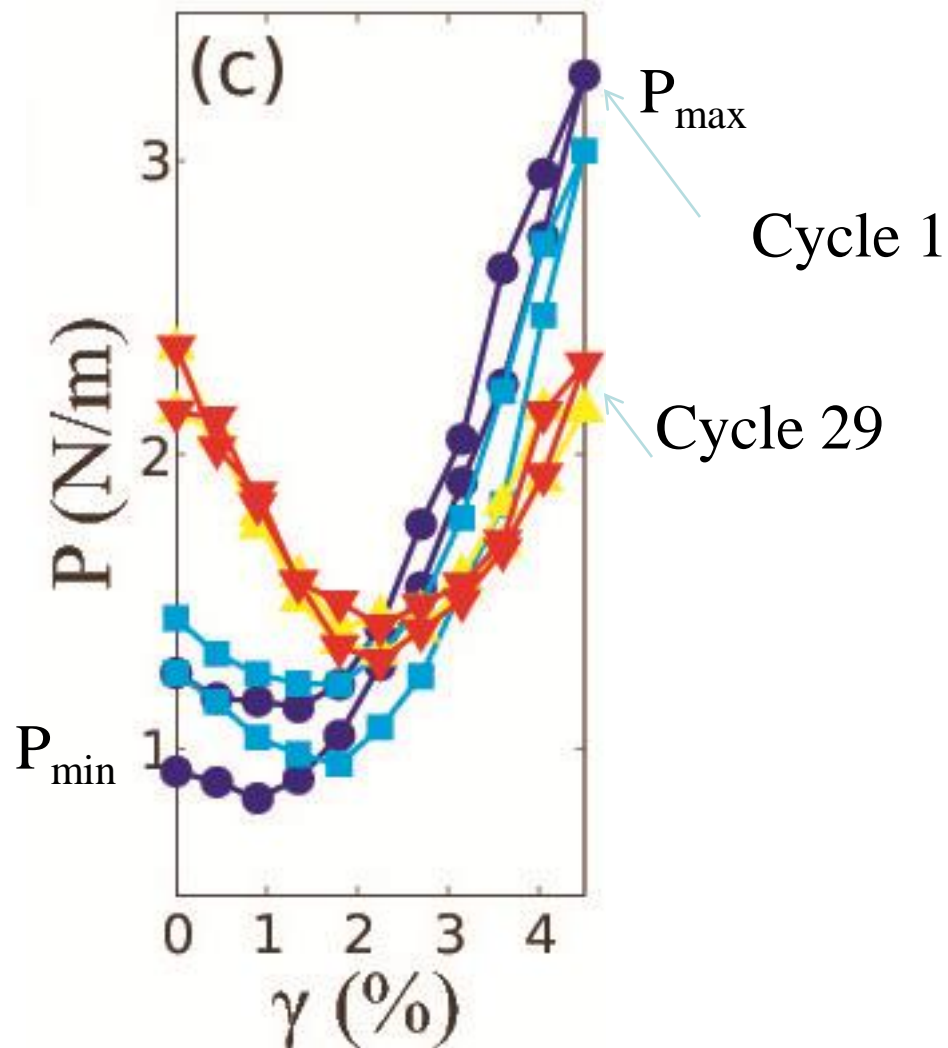
$\gamma \sim 0.5 - 10\%$ $t = 100-500$ cycles

Apply symmetric cyclic shear—rapid relaxation to limit cycle

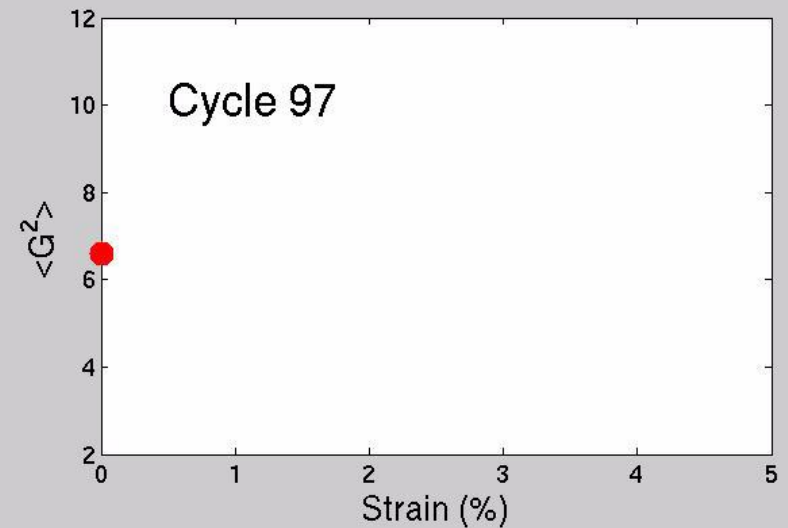
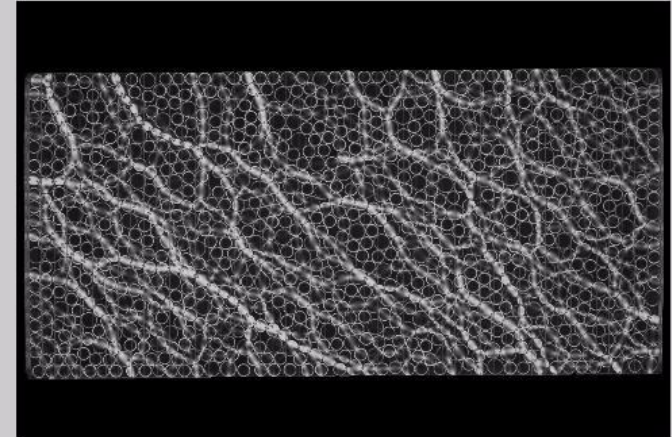
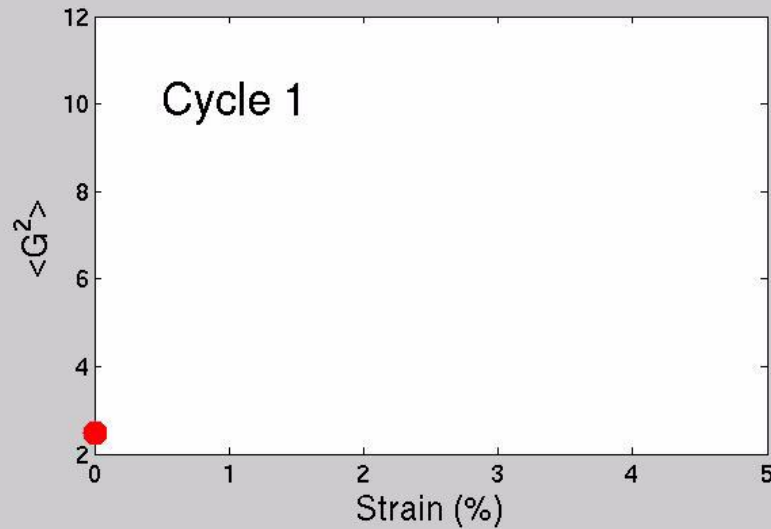
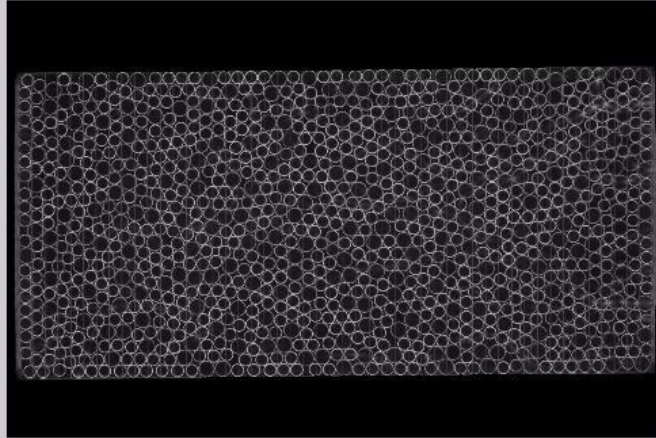


Apply asymmetric cyclic shear: note slow relaxation

$$\Delta P = P_{\max} - P_{\min}$$



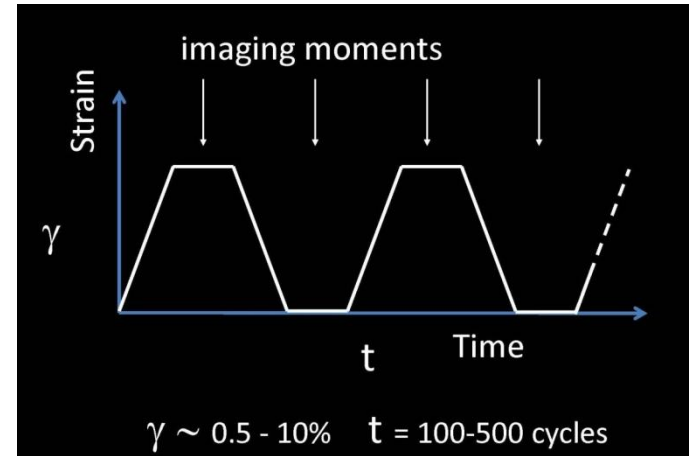
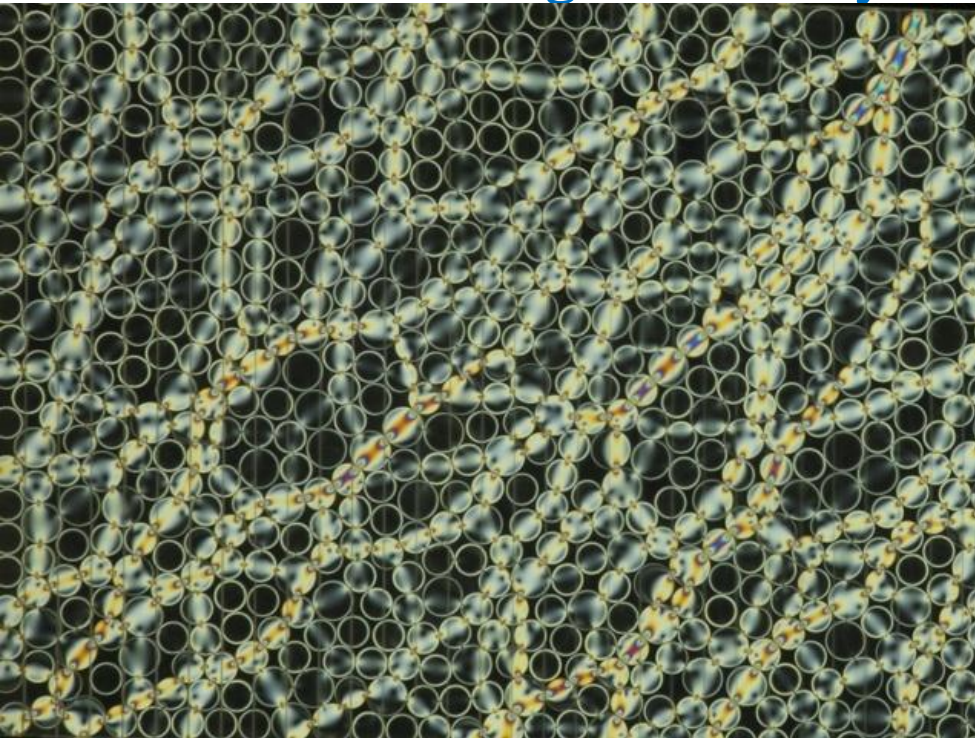
Apply asymmetric cyclic shear: note slow relaxation
(time-lapse videos of quasistatic shear)



Networks are at core of evolving granular systems—e.g.

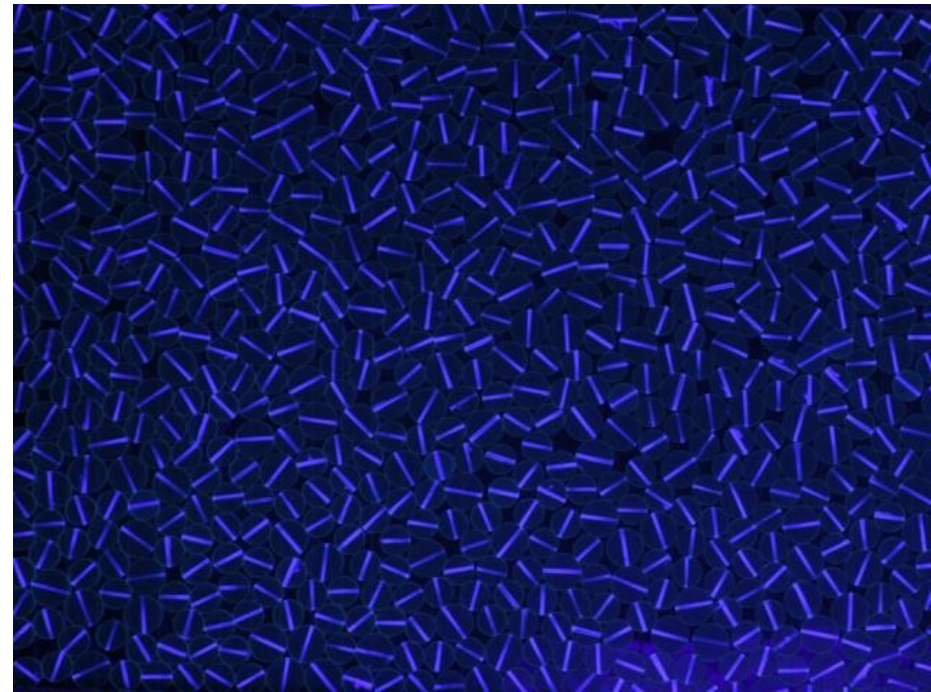
Strobed images-shear cycles: **stress activated process**

← stresses fluctuate

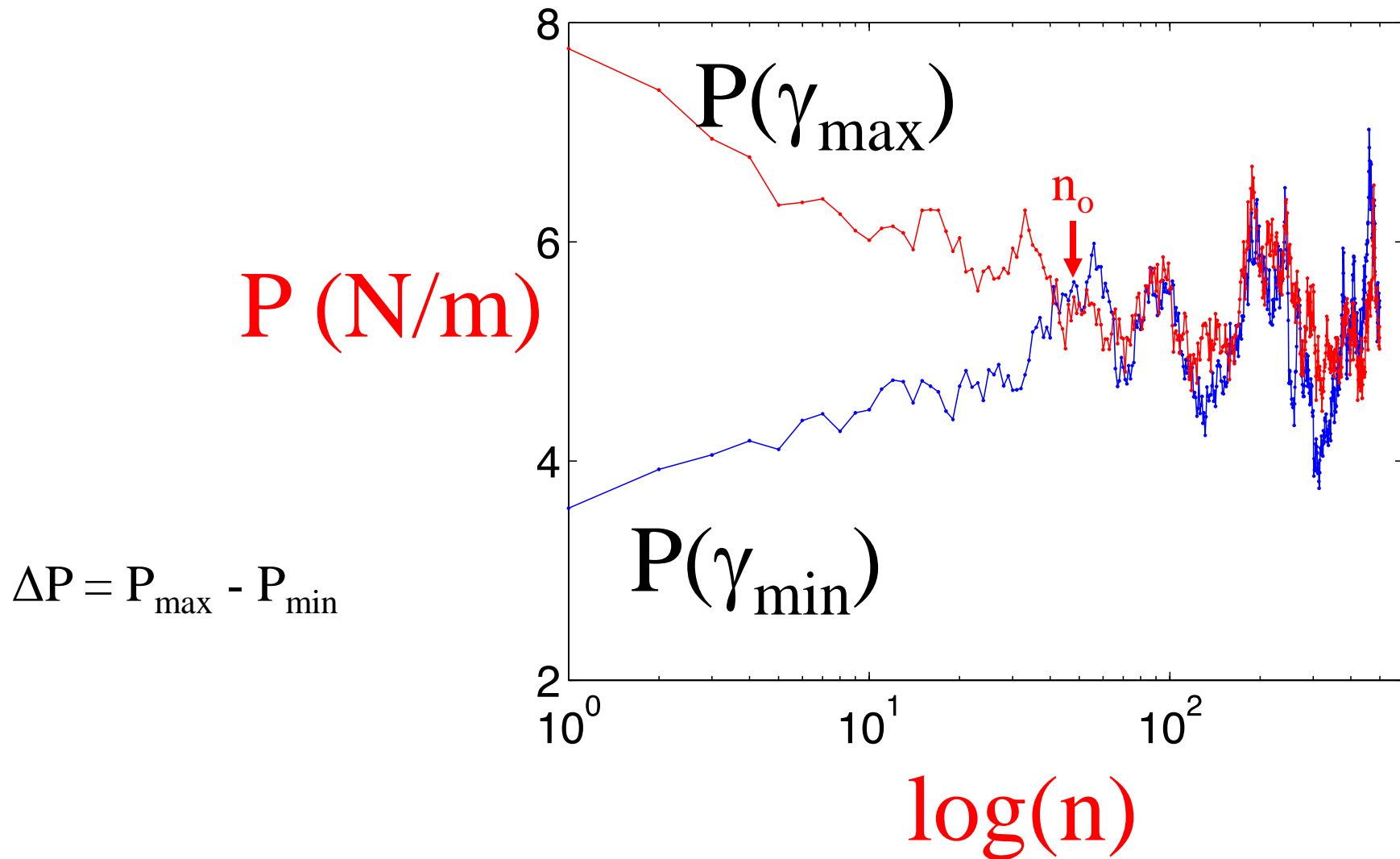


Stress, position, rotation—
All evolve over many cycles

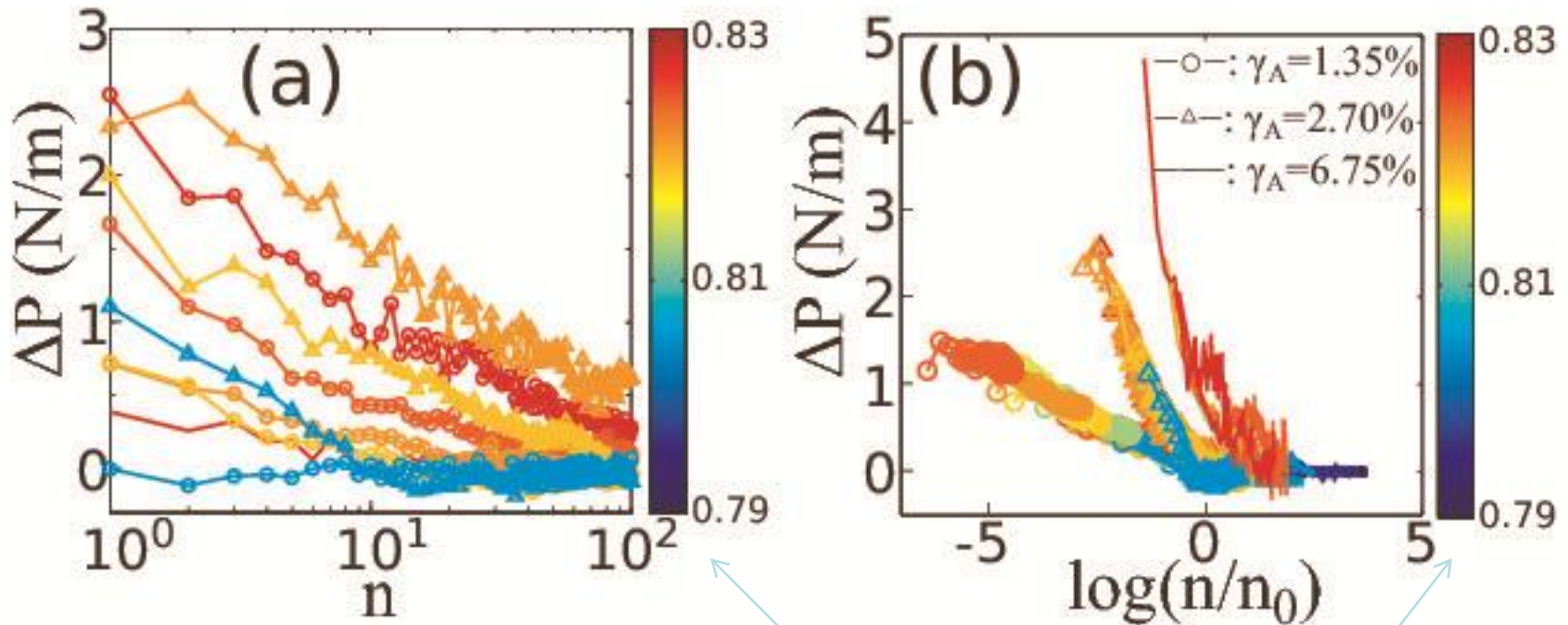
Positions are nearly frozen →



Apply asymmetric cyclic shear: note slow relaxation



Asymmetric shear:
1) log-relaxation:
2) simple φ and γ dependence

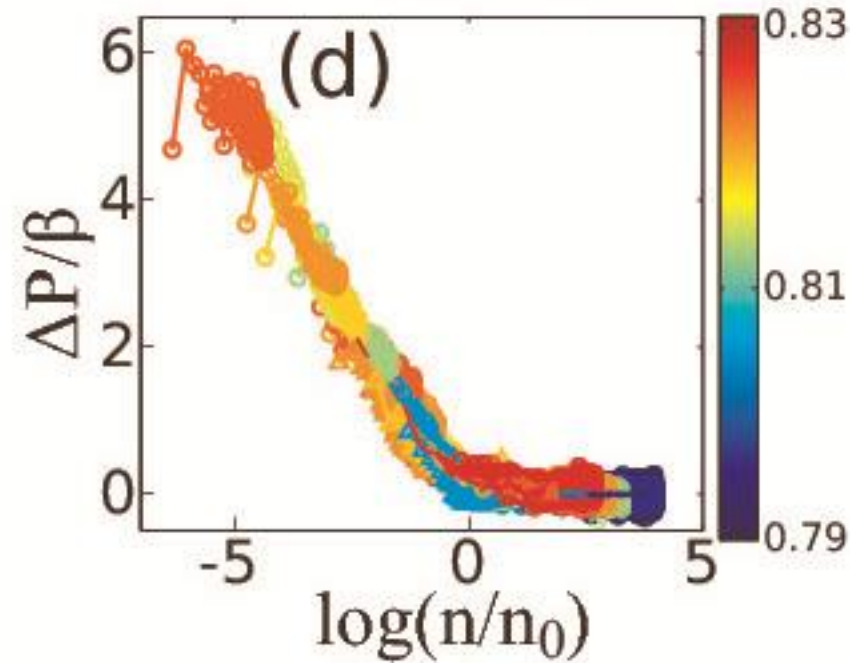
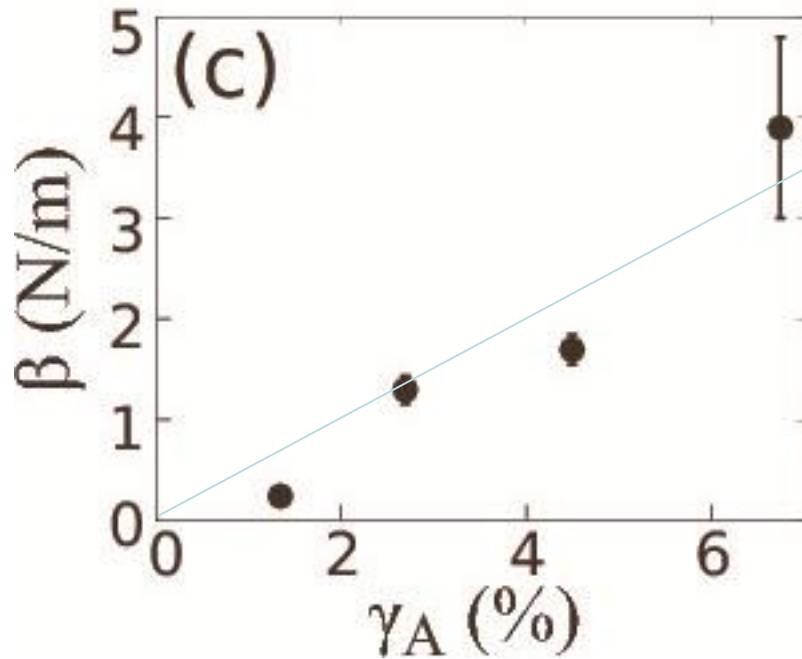


$$\Delta P = -\beta \ln(n/n_0)$$

Colors encode density

Universal relaxation:
consistent with activated process in a stress ensemble

β is temperature-like—a candidate for
a granular ‘thermometer’ for shear

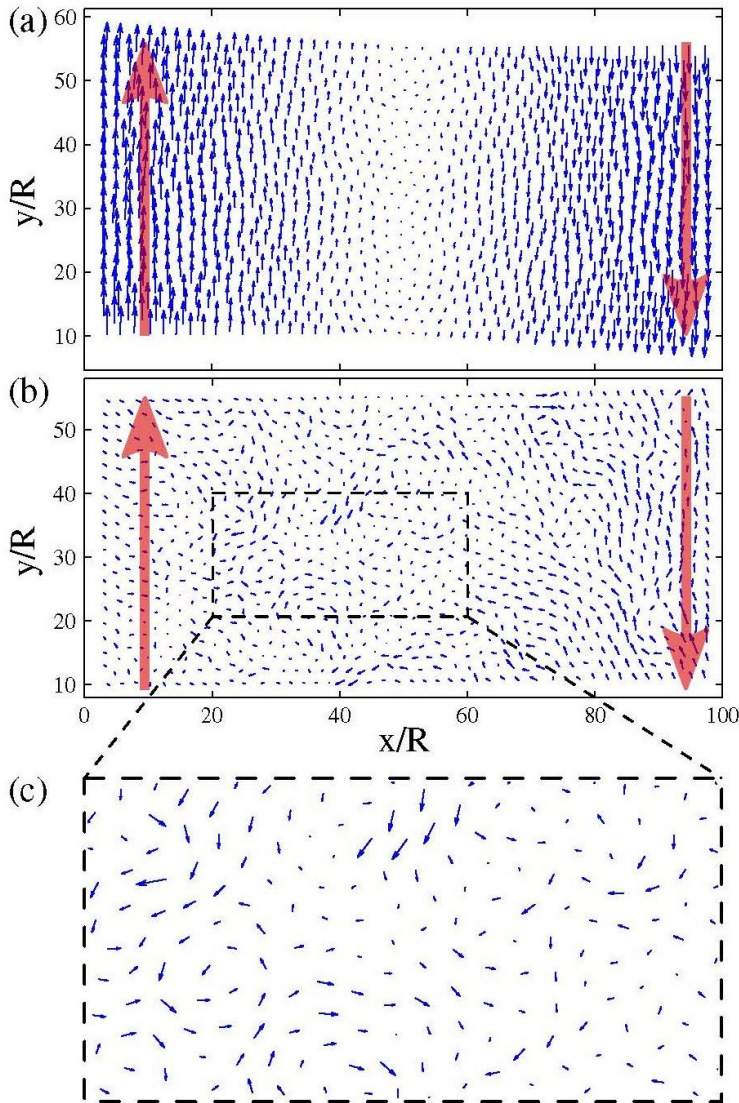


$$\Delta P = -\beta \ln(n/n_0)$$

$$n/n_0 = \exp(-\Delta P/\beta)$$

What are the microscopic processes that enable shear jamming and memory in granular materials?

Actual particle motions are very small, beyond affine strain
STZ evolution is not at play here—relaxes stress
hence not conducive to jamming

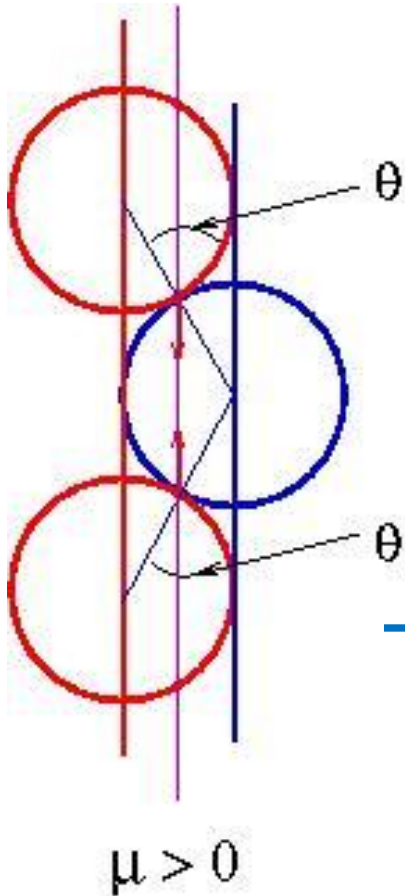


Affine motion of each grain, after a strain of 0.2, to scale

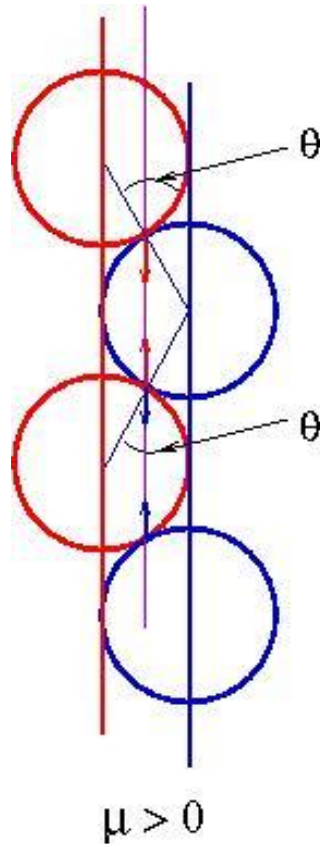
Arrows show nonaffine motion of each grain, multiplied by 3.5, after a strain of 0.2

Things that don't happen: 1) 'straight' force chains

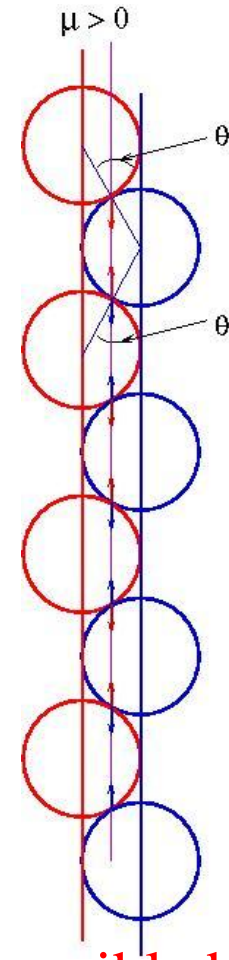
Stable if $\tan(\theta) < \mu$



Continuing force chain-
unique placement



No way for this

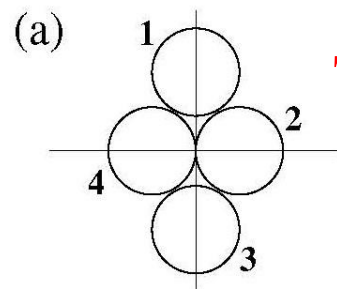


Force chains are not like this: Lines of particles possible but highly improbable

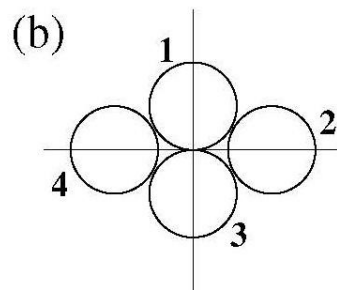
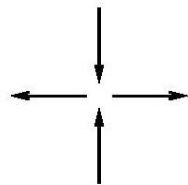
Things that don't happen 2:

$Z_{\text{iso}} = d + 1$ for frictional grains—Force chains cannot stand alone

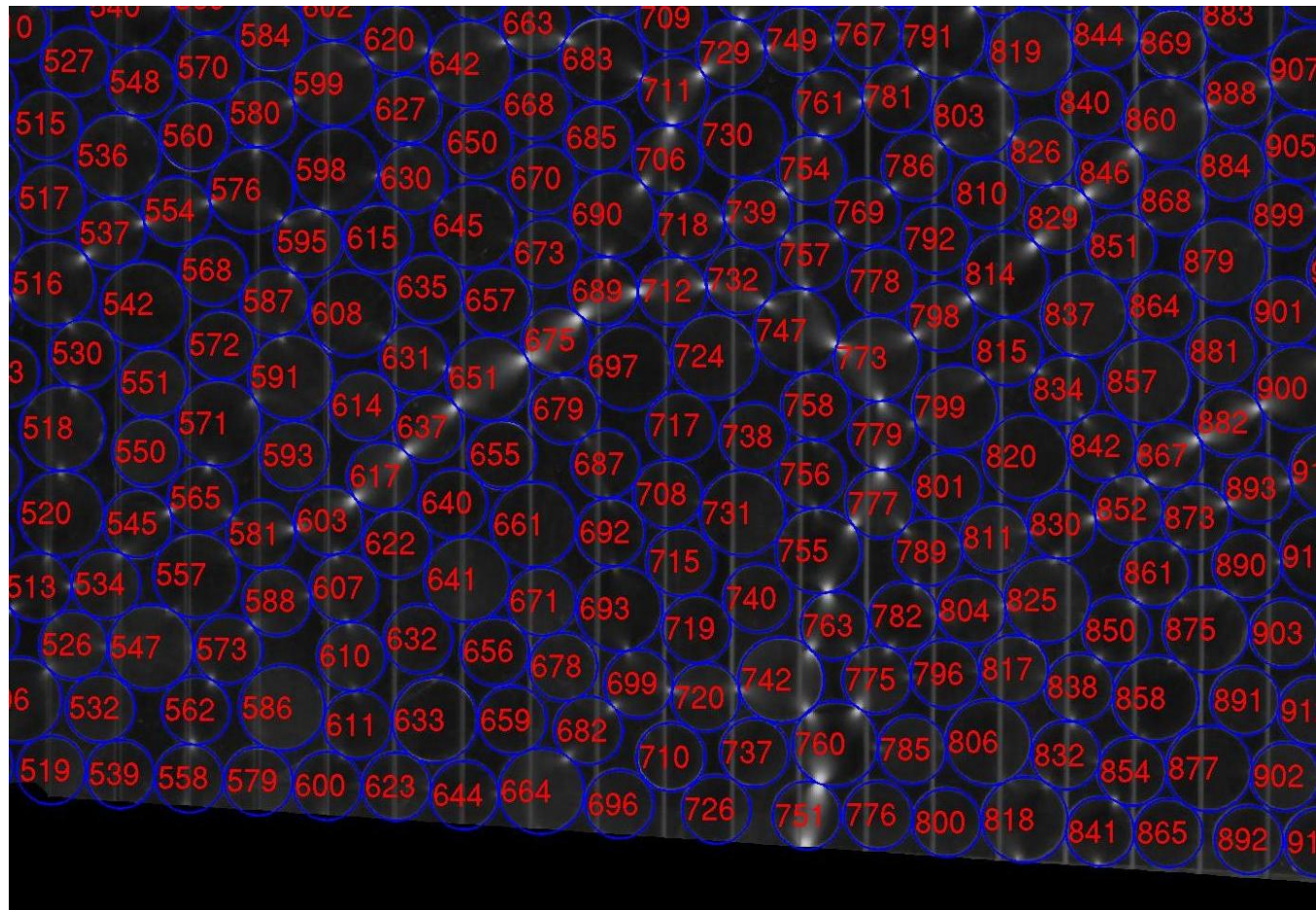
- Things that don't happen: 2) T1 events



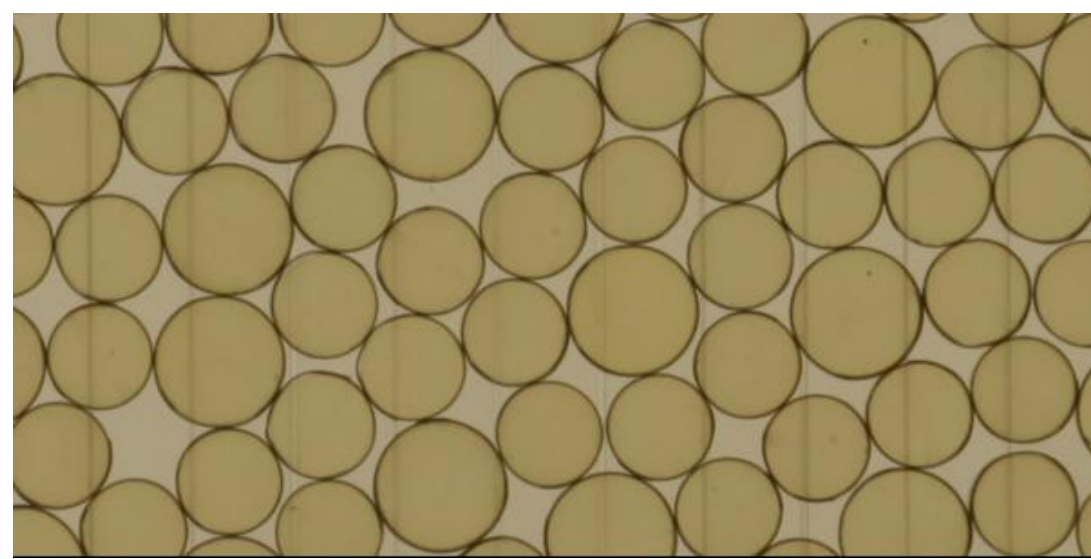
T1 events: relax stresses, geometry differs from chains



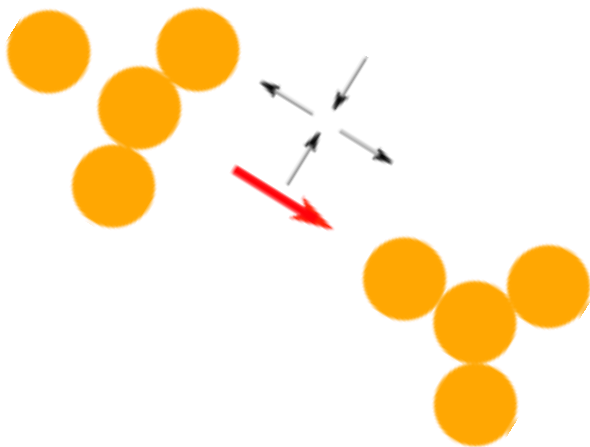
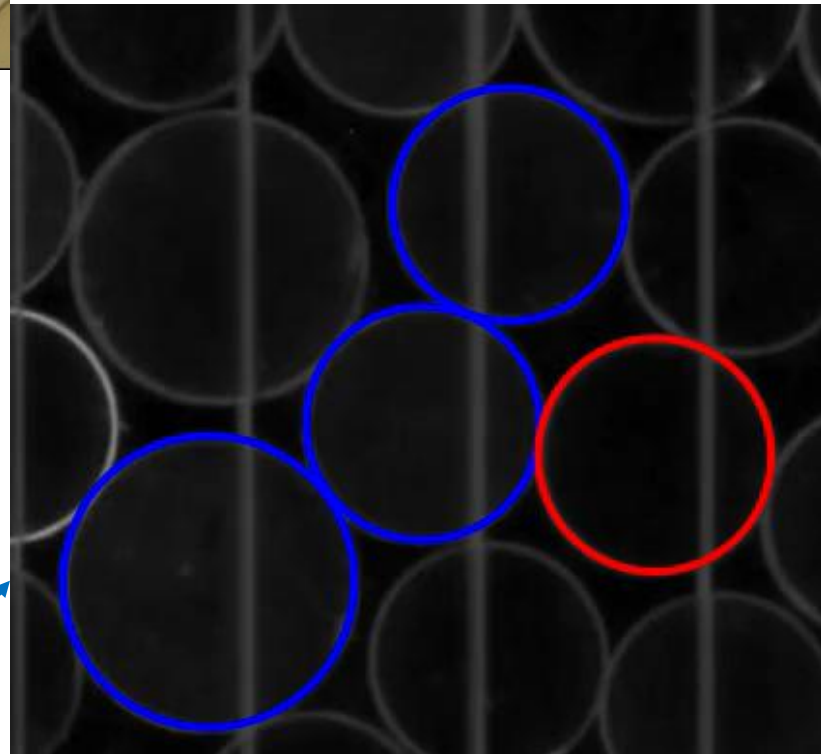
Chains bend, wiggle and intersect at branches



What does happen as chains form? Zoom in on some local processes

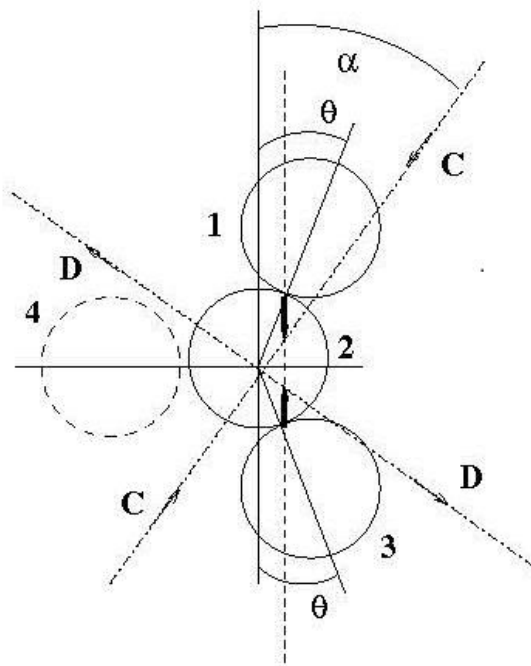


Compression direction



Consider small-scale configurational changes

-Trimers (captures bending) and branches-(chain mergers)



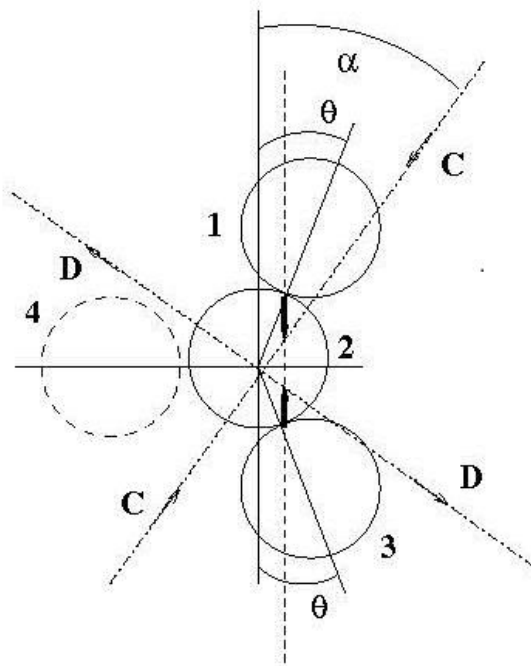
A trimer consists of three (nearly) contacting particles, e.g. 1, 2, 3.

θ measures trimer bending

α measures orientation wrt compression direction

Trimers (captures bending) and branches-(chain mergers)

α moderate: compression pushes 1, 2, and 3 together



continued compression bends trimer
pushes 2 to left faster than affine dilation for most θ

Creates new contacts, e.g. 2 and 4

Branches occur naturally due to initial packing, instability of long force chains, and bending

What do trimers do under shear?

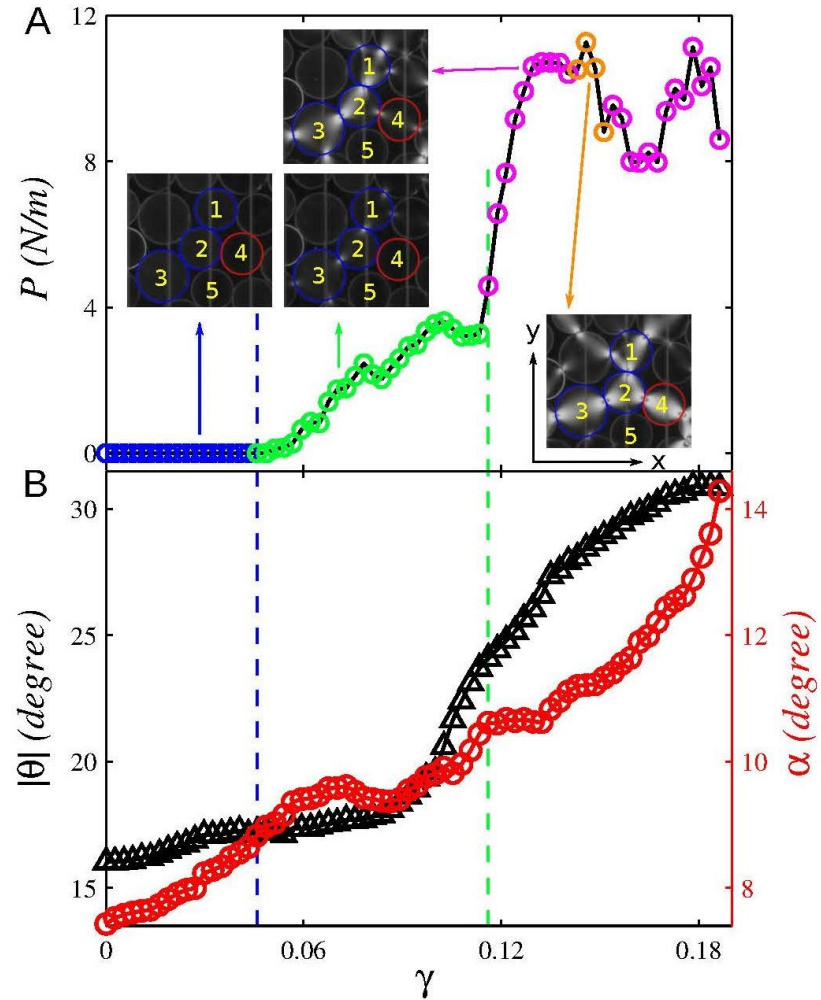
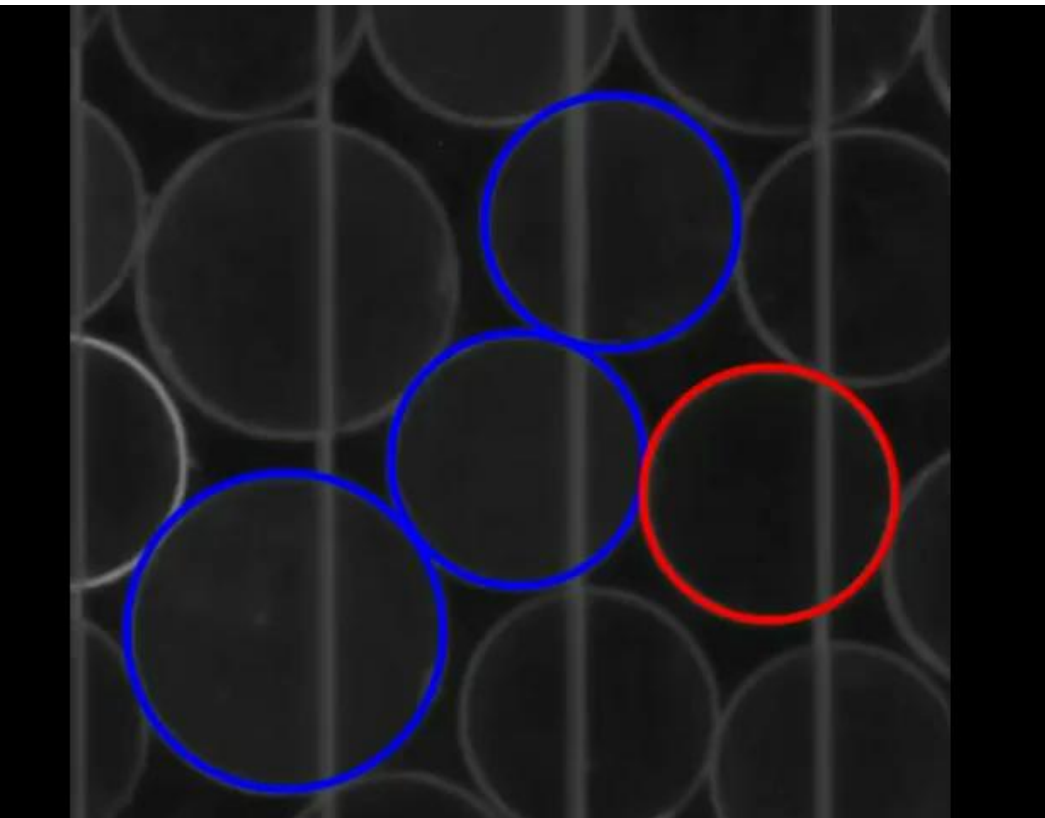
trimer in compression direction

Trimer bends

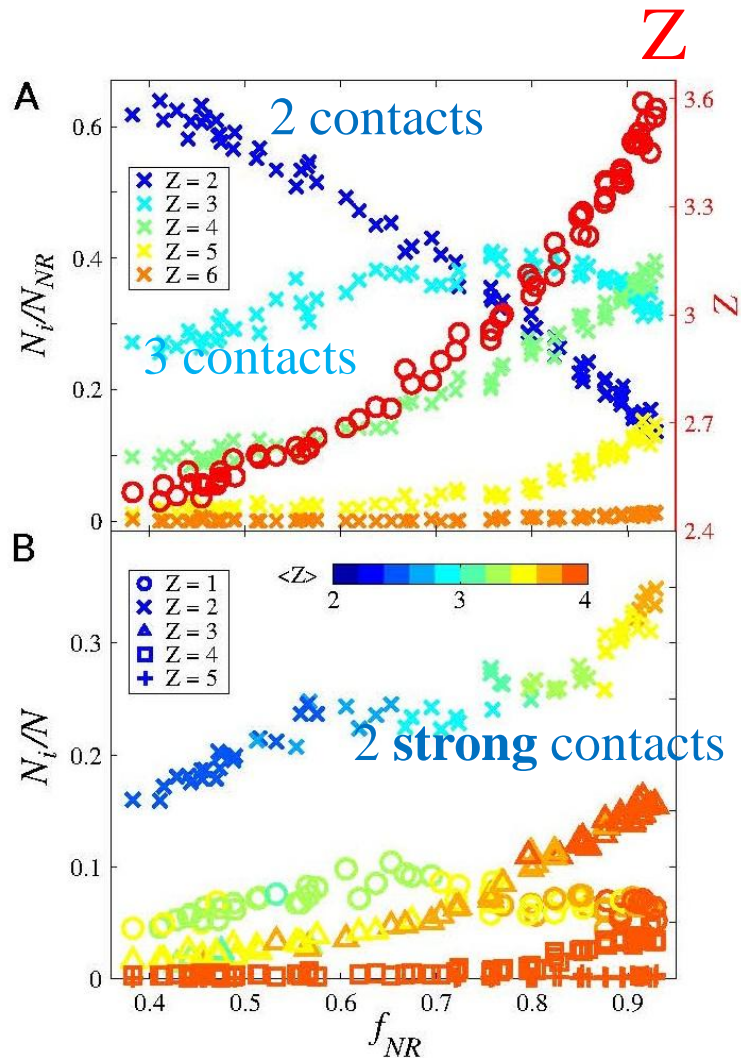
Extra contact forms for middle particle

Force goes up

local processes—now slower



Contact numbers: Conversion from 2-contacts to 3 or more contacts



A: Red circles: system-wide contact number, Z .
Need $Z > 3$ to be jammed—all vs. non-rattler fraction

A: crosses: relative populations of particles with i contacts

B: Contact fractions for the strong network—
Symbols: number of strong Force contacts. Colors: number of total contacts

Define O to include geometric properties of a trimer

$$O = -[(\hat{b}_i \cdot \hat{b}_j - c_{ij}) / [A(1 + c_{ij})]] \cdot \cos(2\alpha)$$

*Normalization

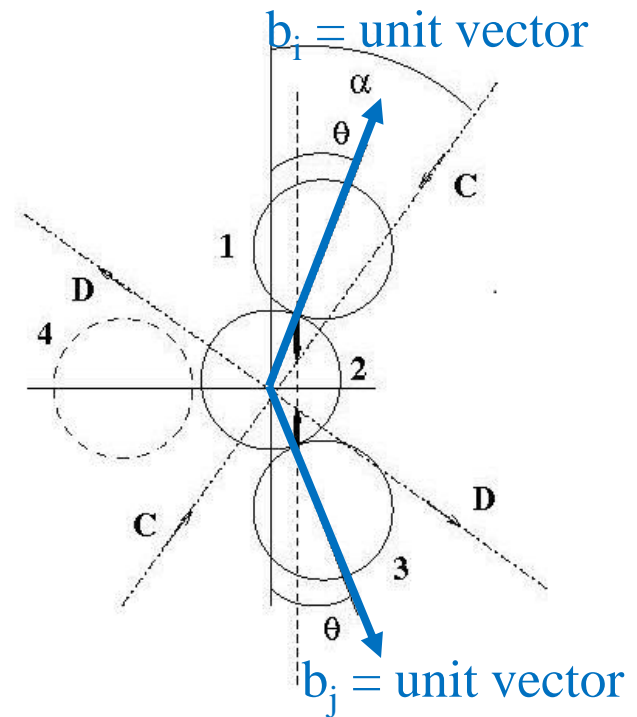
$$-[(\hat{b}_i \cdot \hat{b}_j - c_{ij}) / (1 + c_{ij})] \cdot \cos(2\alpha),$$

Trimer 'straightness',
0 to 1

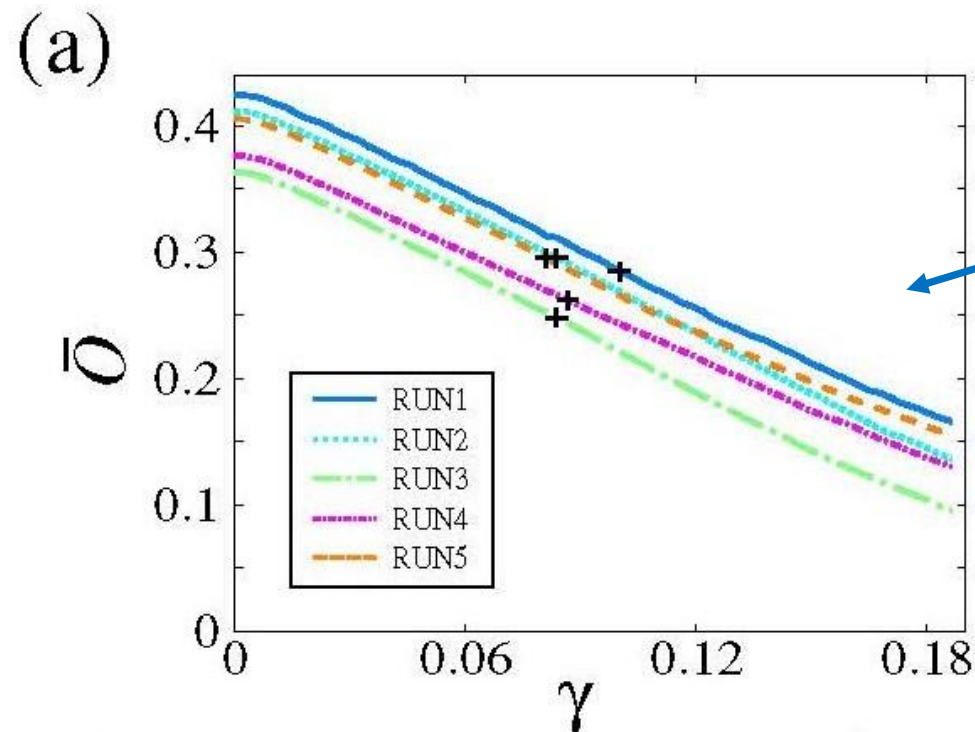
Trimer alignment with
compression direction,
-1 to 1

O for particles in strong network decreases
with shear as trimers bend and rotate

*Normalization: $\langle O \rangle = 1$ for uniform
distribution in allowed θ , and only in
compression direction



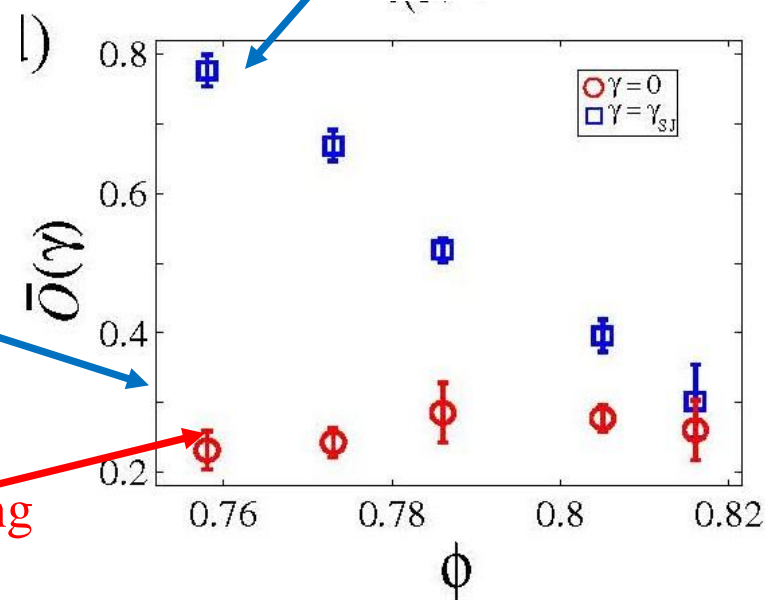
$\langle O \rangle$ for trimers with $O > 0$



Average O vs. γ for $\phi = 0.805$
For trimers in the network at jamming

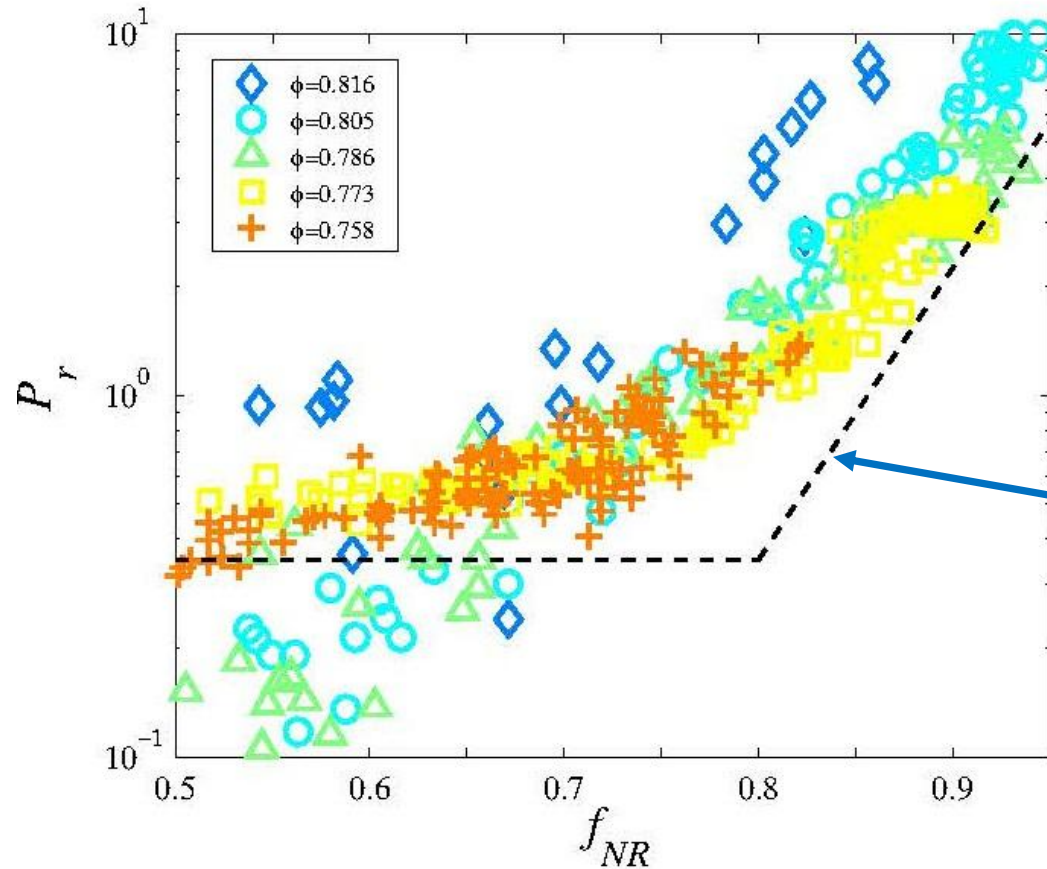
$\langle O \rangle$, Trimers in network at shear jamming

$\langle O \rangle$ before shearing



$\langle O \rangle$ at shear jamming

Pressure from particles in trimers with $O \geq 0$



Dashed line:
P from particles
in trimers
below $O = 0$

Shear jamming, force networks, and structural evolution

- Shear jamming **creates** strong networks at fixed volume
- Networks reflect initial conditions and protocol
- In the absence of shear banding, cyclic shearing writes and rewrites memory into force network
- **Small conformational changes enable these processes**
- Trimers, branches and contact evolution capture changes
- Provides first steps towards systematic understand of network evolution in frictional granular materials

