

# The Hidden World of Sand



[www.atacamaphoto.com](http://www.atacamaphoto.com)

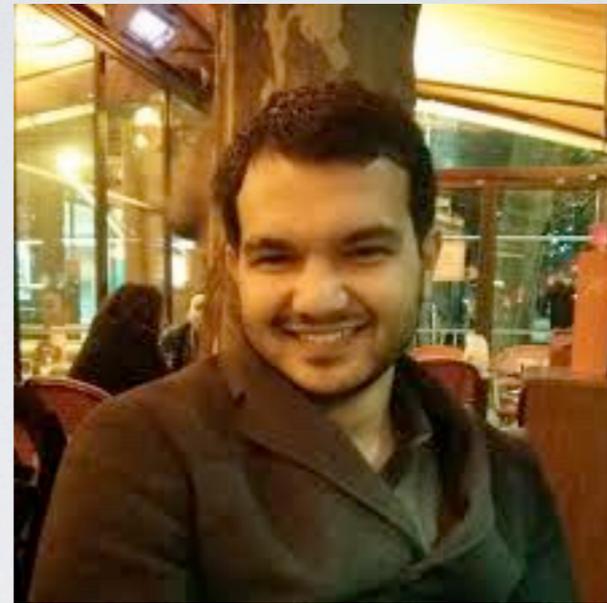




Dapeng Bi



Sumantra Sarkar



Kabir Ramola



Jetin Thomas



Bob Behringer,



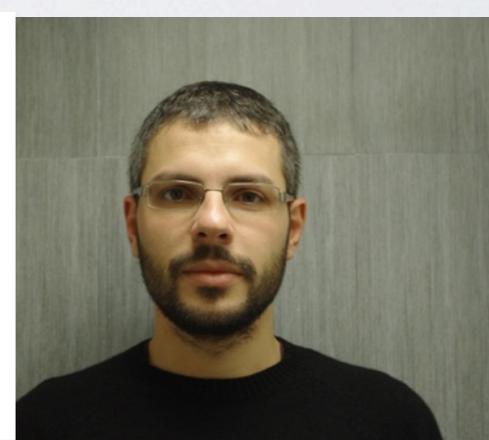
Jie Ren



Dong Wang



Jeff Morris



Romain Mari



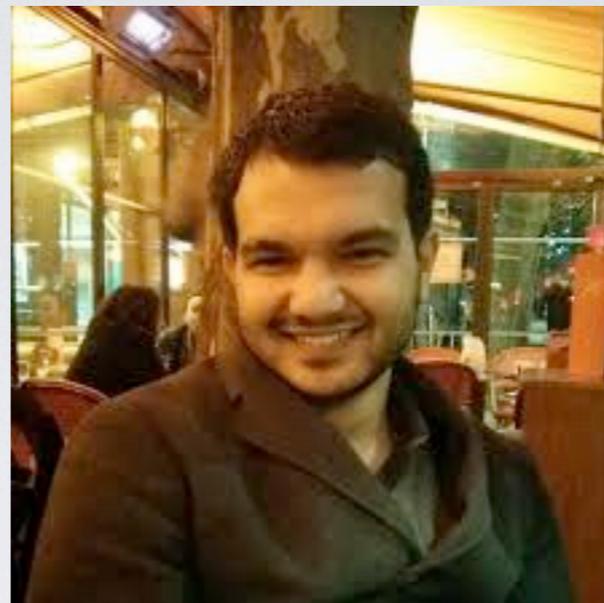
Abhi Singh



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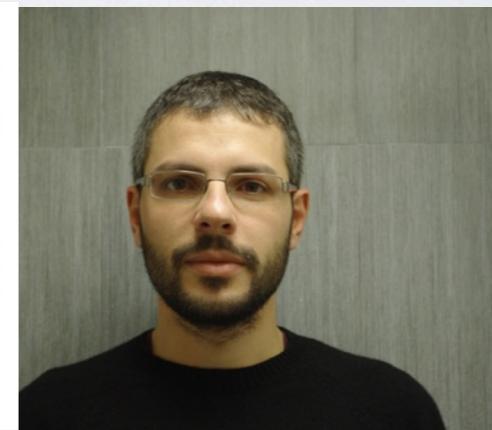
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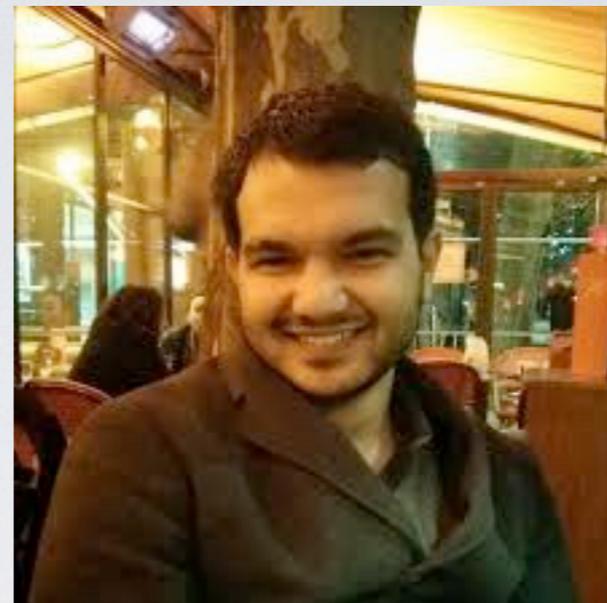
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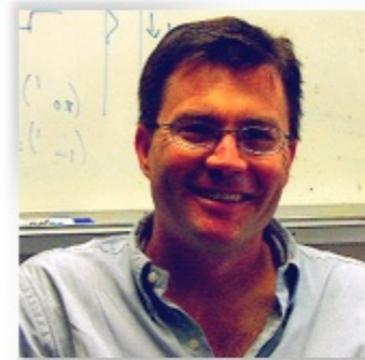
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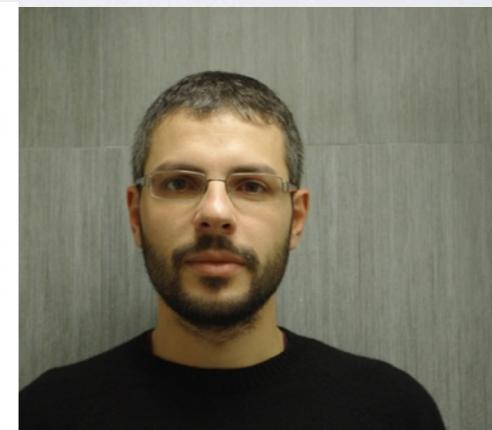
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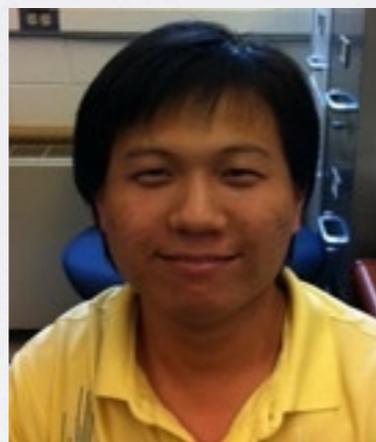
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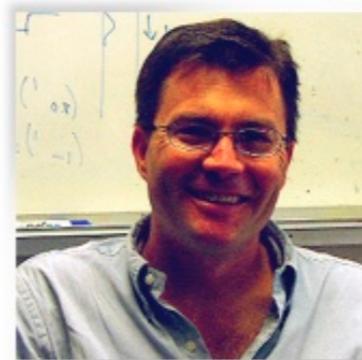
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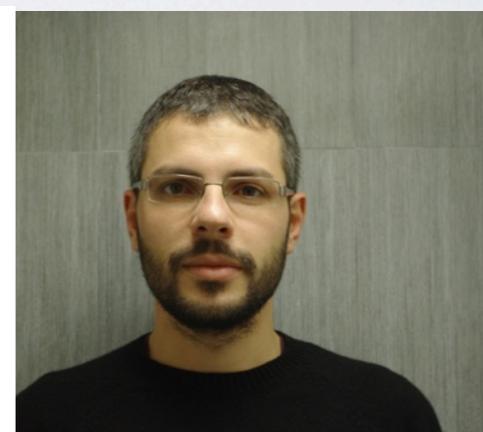
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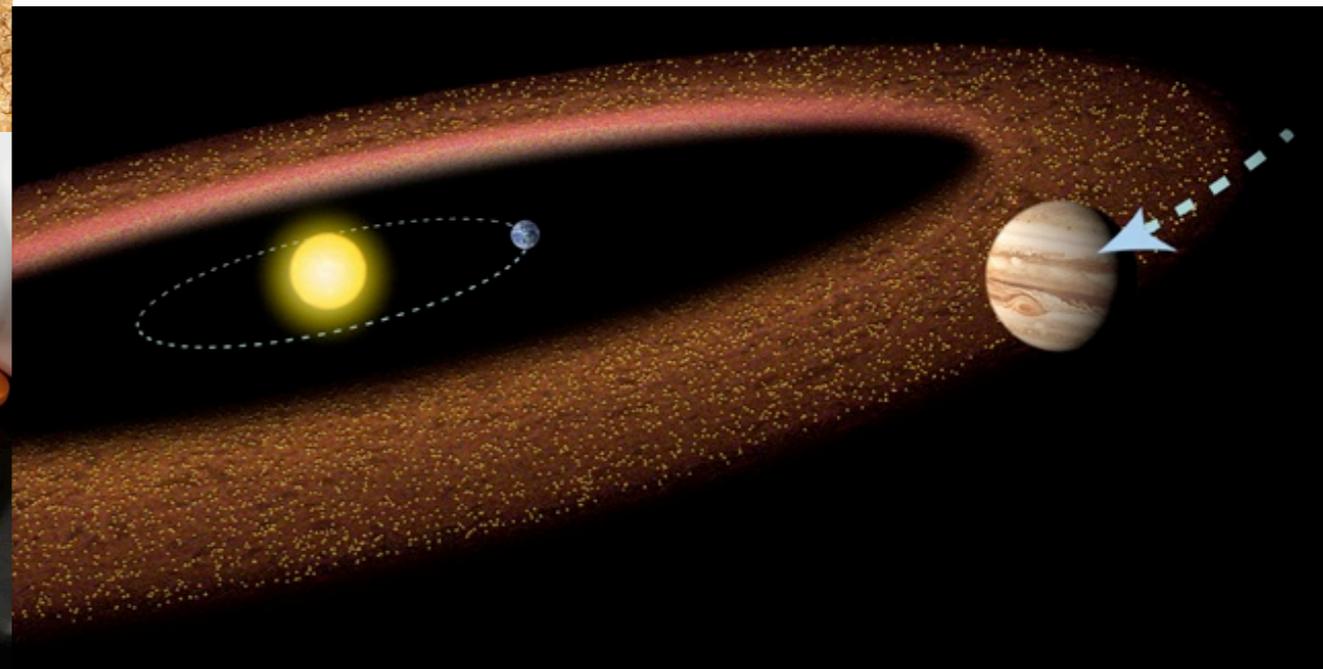


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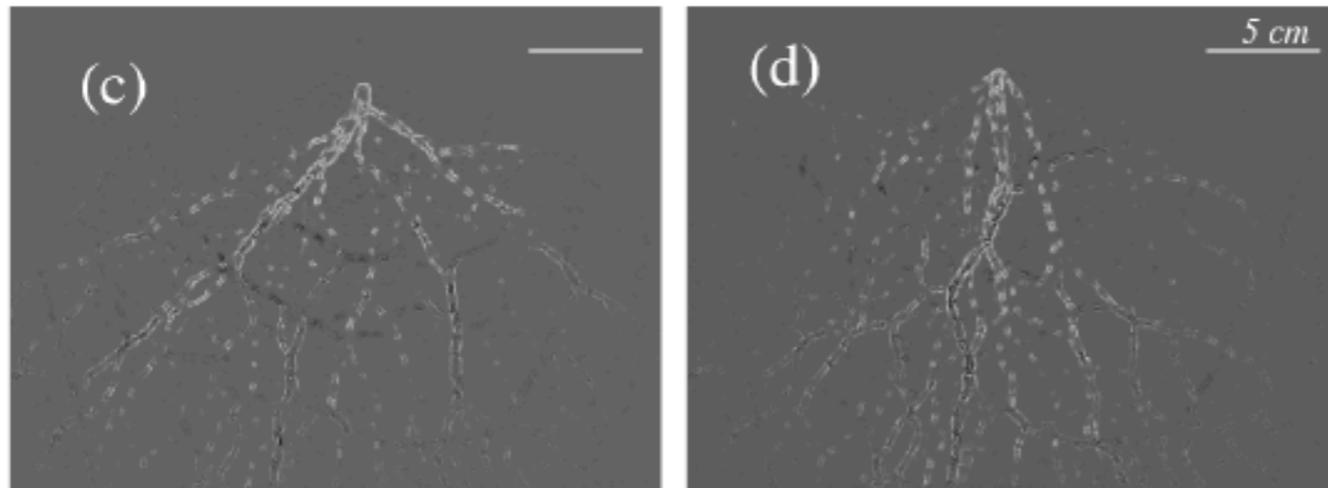
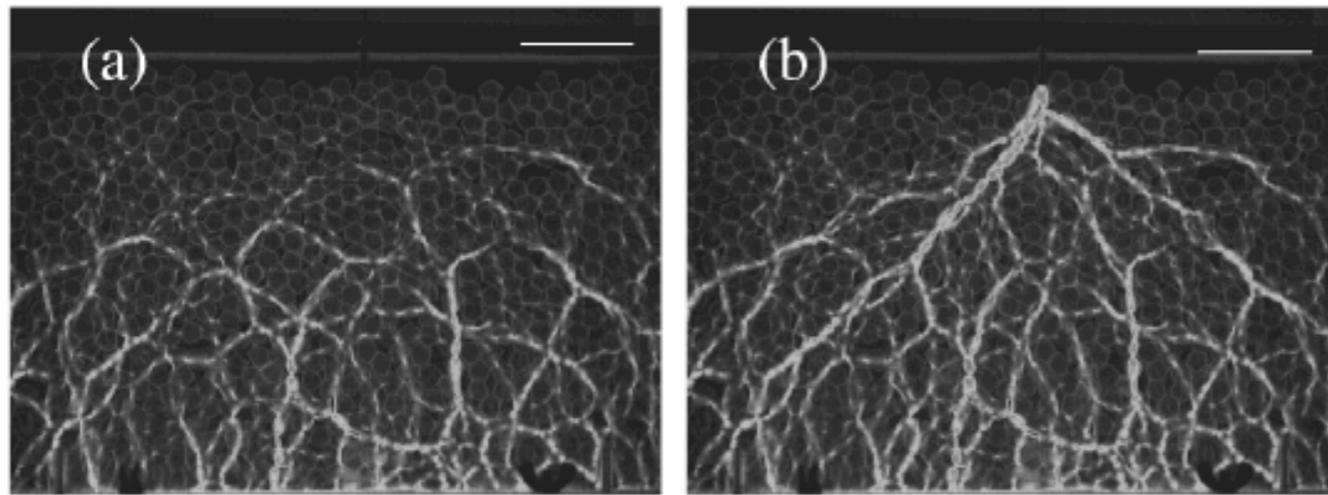
# GRANULAR WORLD



- ▶ **Collection of macroscopic objects**
- ▶ **Purely repulsive, contact interactions. No thermal fluctuations to restore broken contacts**
- ▶ **Friction: Forces are independent degrees of freedom**
- ▶ **States controlled by driving at the boundaries or body forces: shear, gravity**
- ▶ **Non-ergodic in the extreme sense: stays in one configuration unless driven**

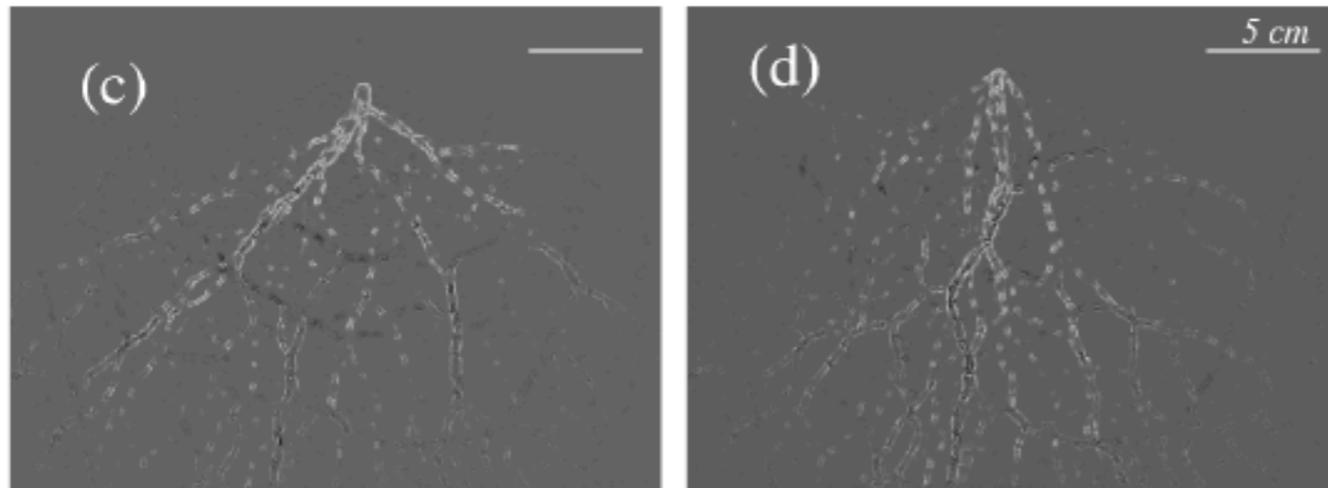
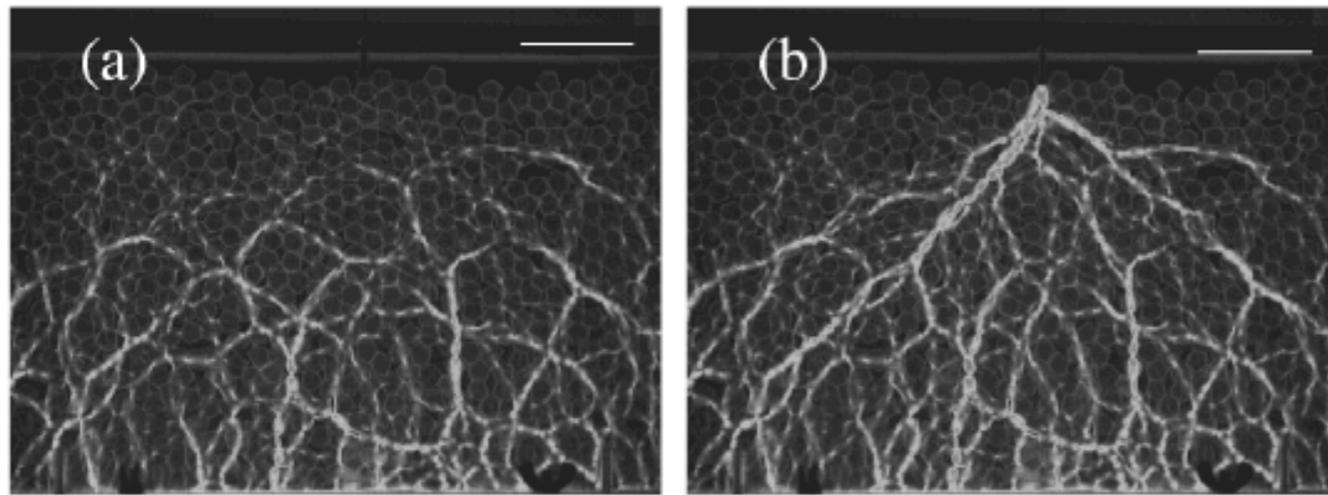


# How do granular materials respond to applied forces?



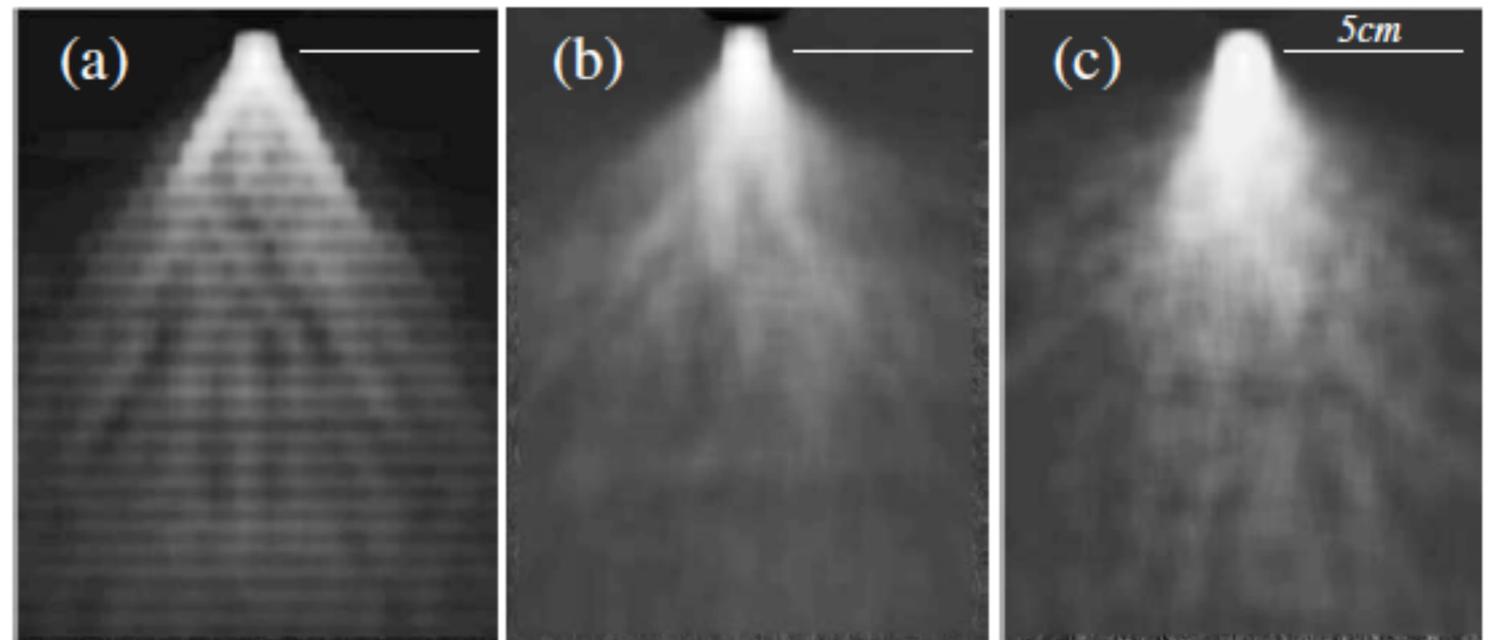
“Forces are carried primarily by a tenuous network that is a fraction of the total number of grains” Geng et al, PRL (2001)

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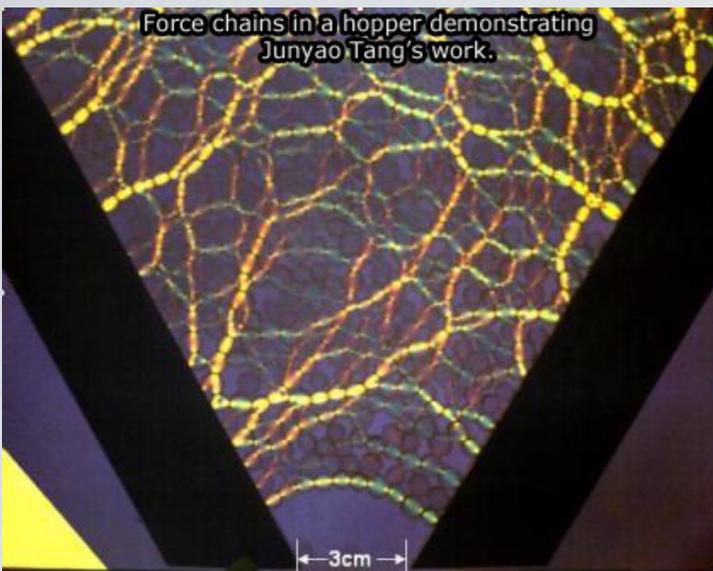
Ensemble averaged patterns are sensitive to nature of underlying spatial disorder



# LOOKING INSIDE SAND



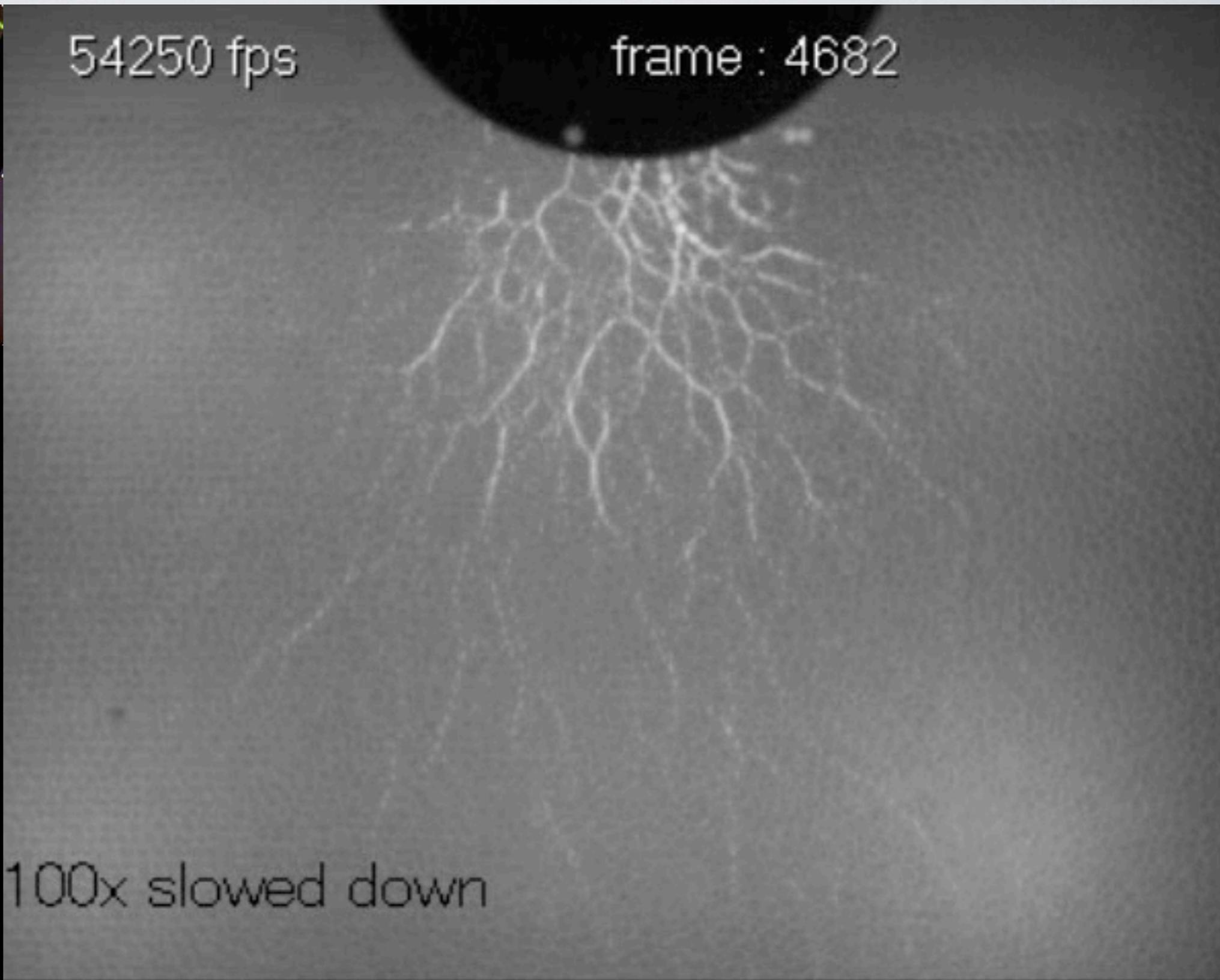
# LOOKING INSIDE SAND



54250 fps

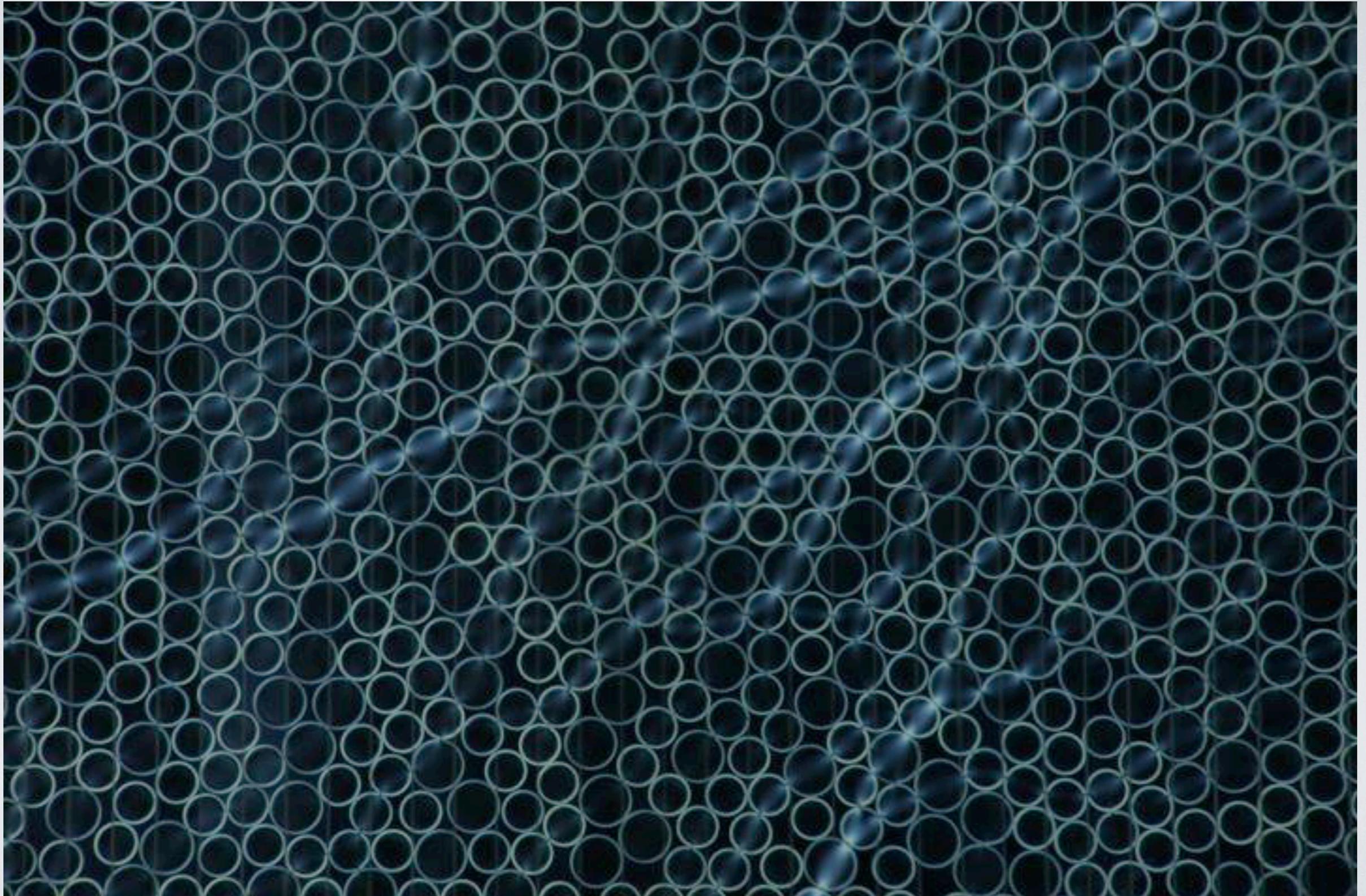
frame : 4682

100x slowed down



# Stress Metric

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# Statics of Granular Media: Constraints of mechanical equilibrium determine collective behavior

Local force & torque balance satisfied for every grain

Friction law on each contact

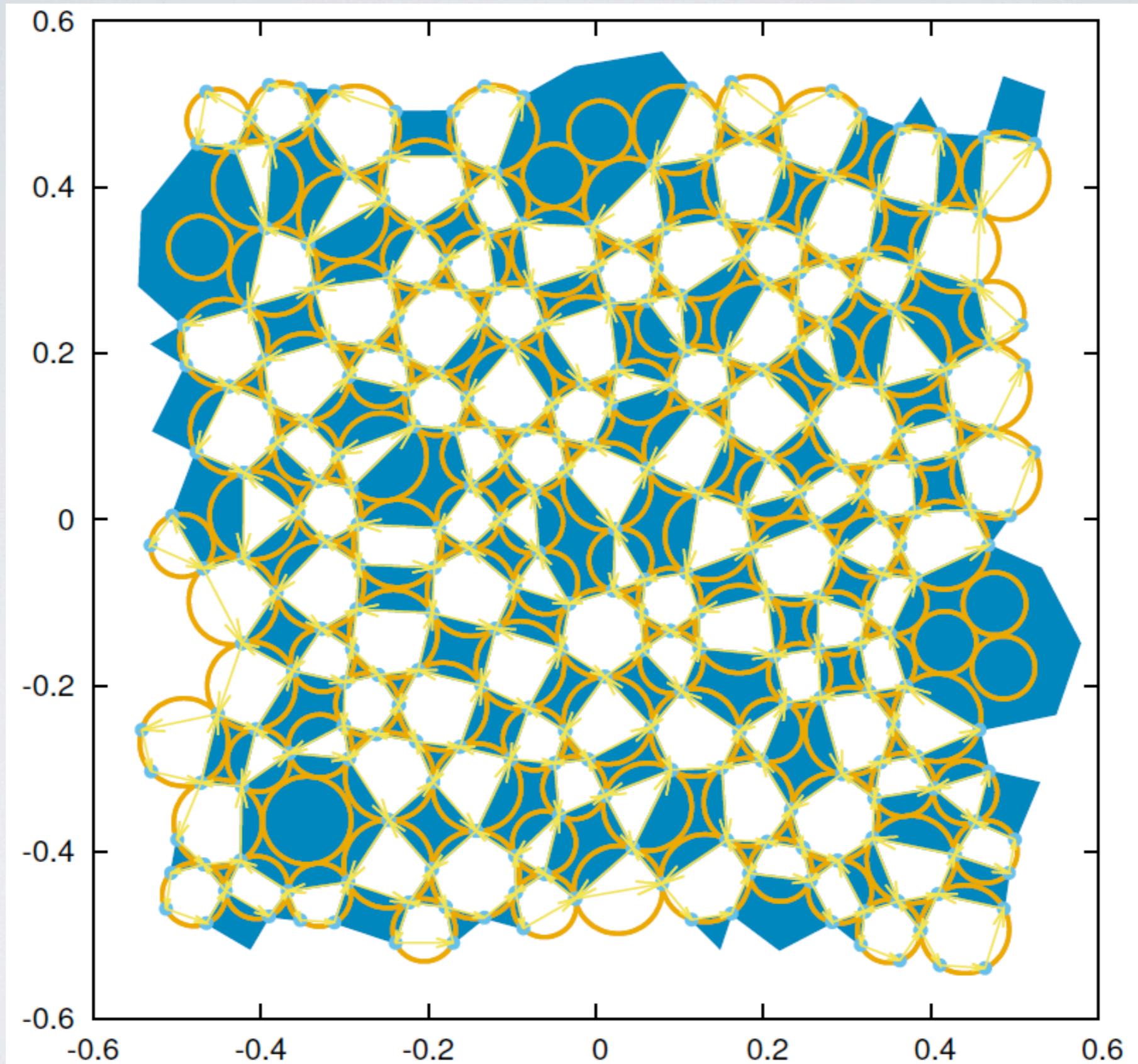
$$f_t \leq \mu f_N$$

Positivity of all forces

$$f_N \geq 0$$

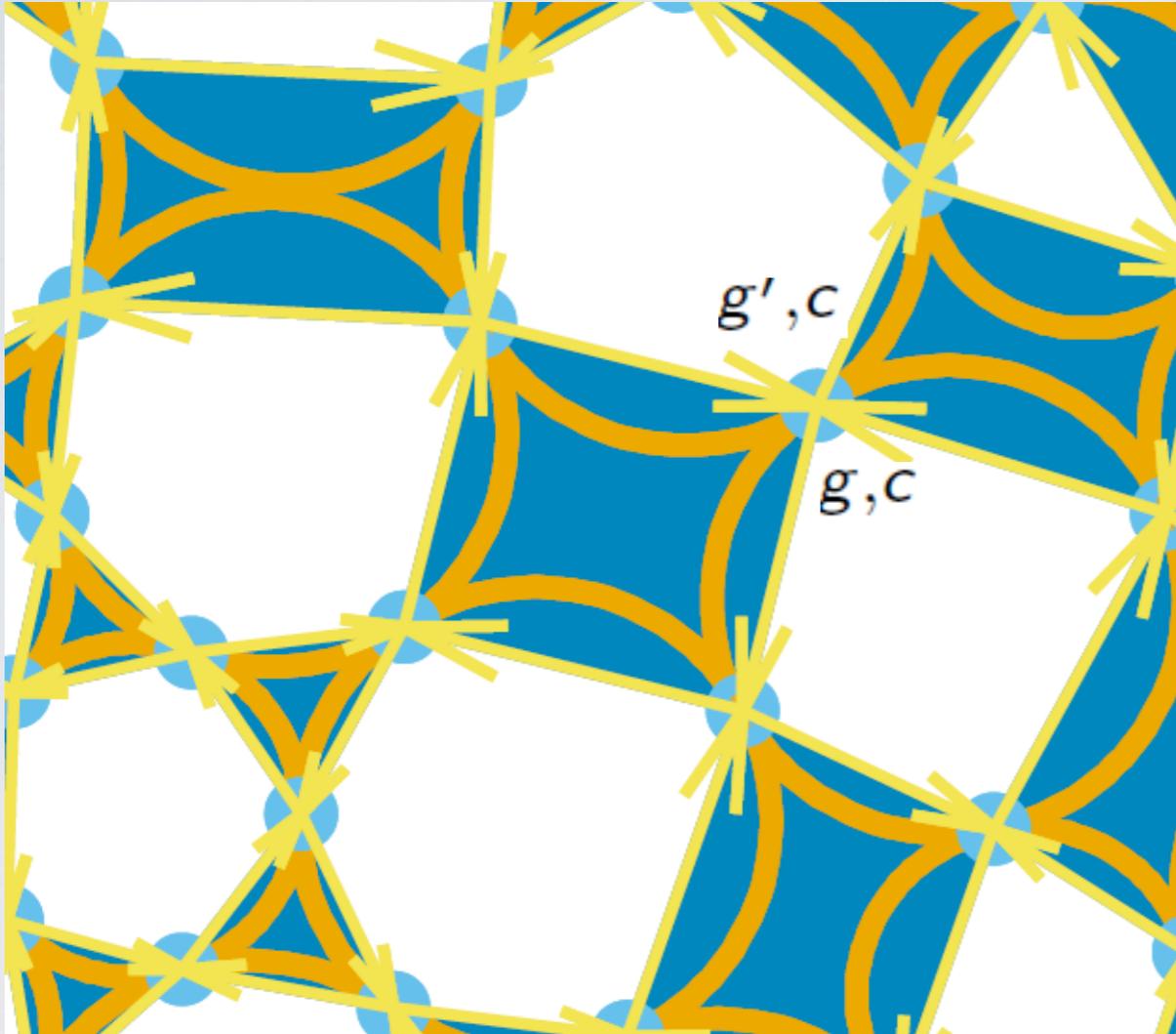
Imposed stresses determine sum of stresses over all grains

# Imposing force balance (2D)



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Forces on every grain sum to zero:

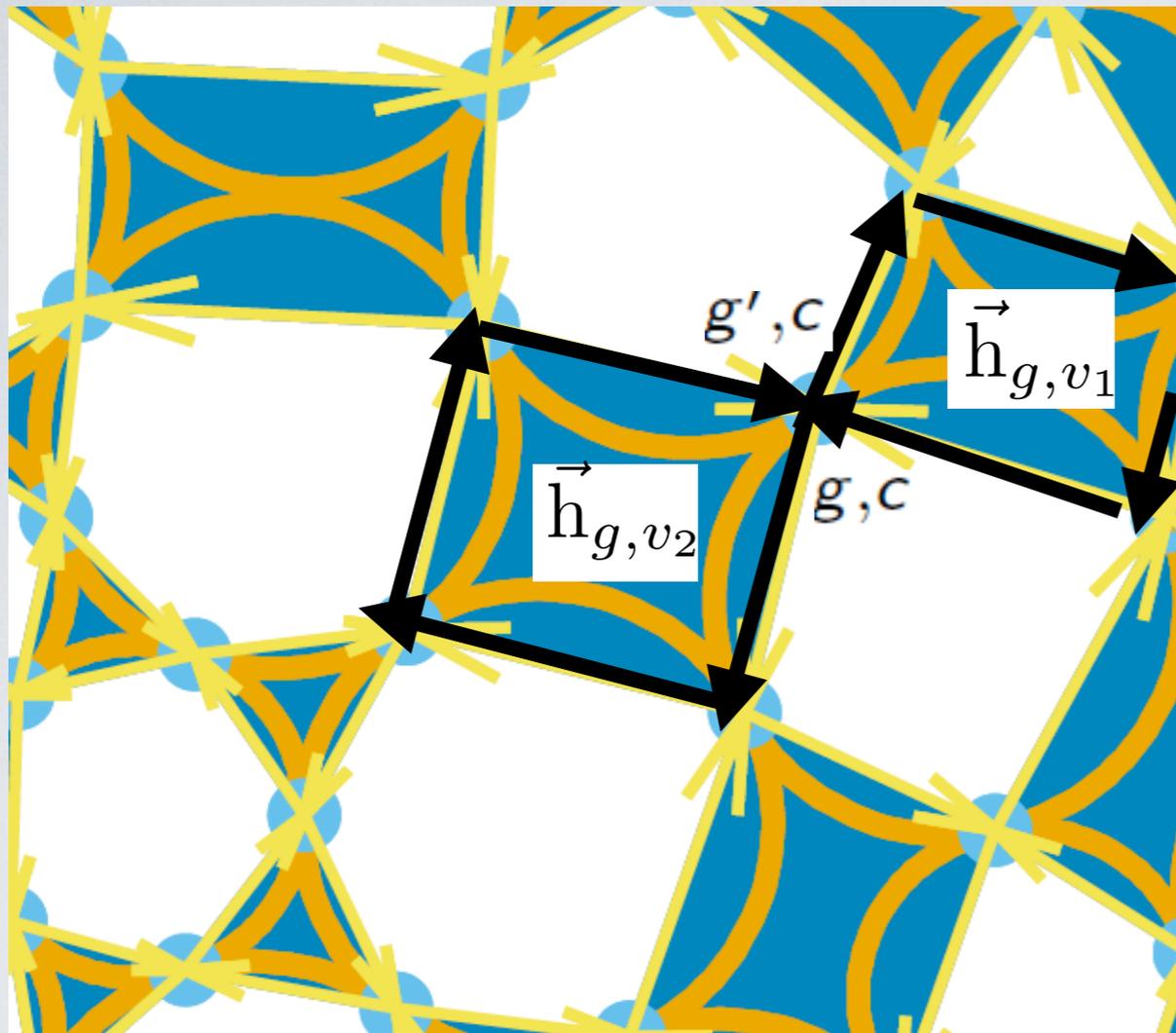
$$\sum_c \vec{f}_{g,c} = 0.$$

Newton's third law dictates:

$$\vec{f}_{g,c} = -\vec{f}_{g',c}$$

# Height Representation

Ball & Blumenfeld, 2003



$$\begin{aligned}\vec{f}_{g, c_1} &= \vec{h}_{g, v_1} - \vec{h}_{g, v_2}, \\ \vec{f}_{g, c_2} &= \vec{h}_{g, v_2} - \vec{h}_{g, v_3}, \\ \vec{f}_{g, c_3} &= \vec{h}_{g, v_3} - \vec{h}_{g, v_4}, \\ \vec{f}_{g, c_4} &= \vec{h}_{g, v_4} - \vec{h}_{g, v_1}.\end{aligned}$$

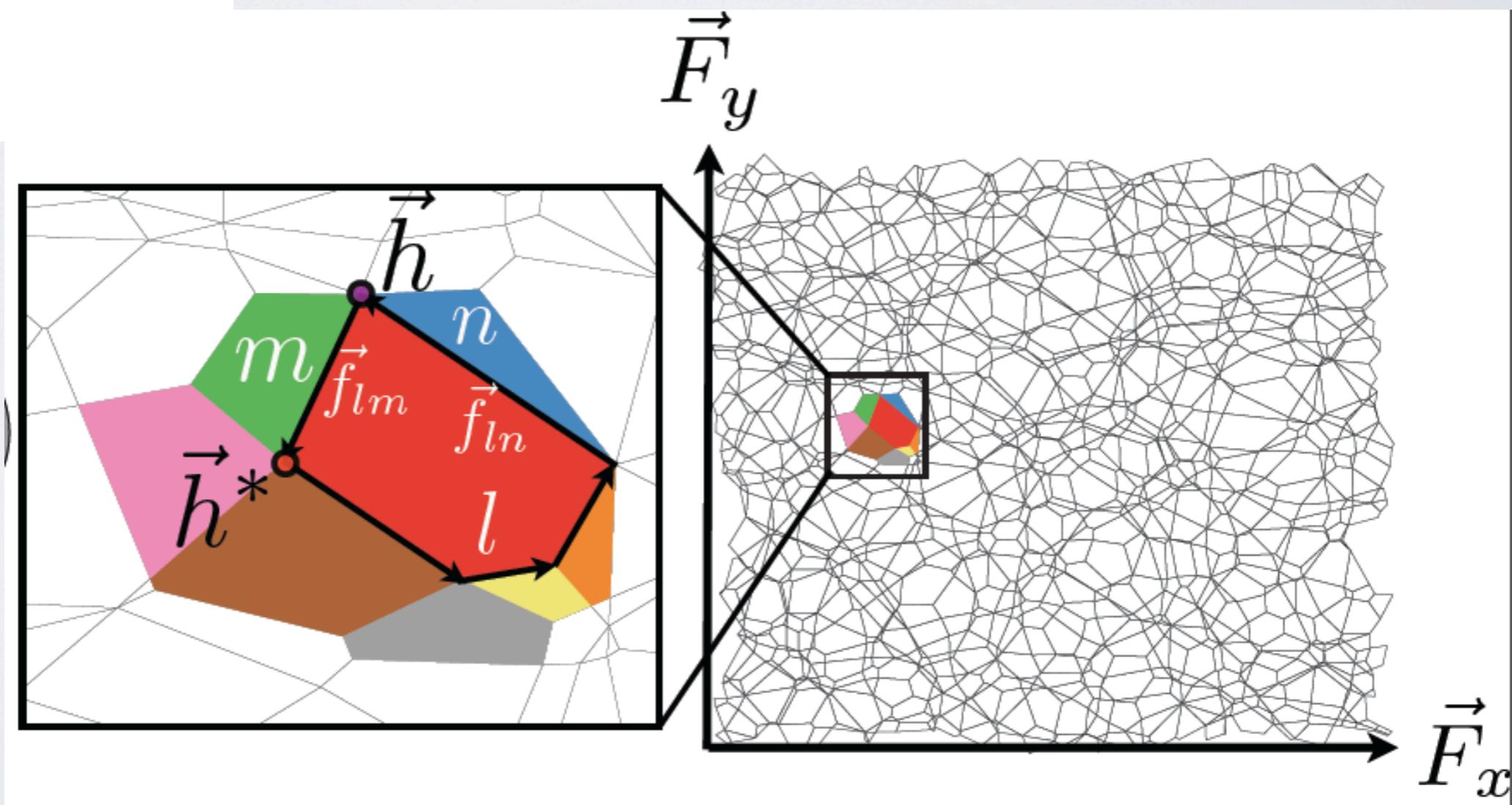
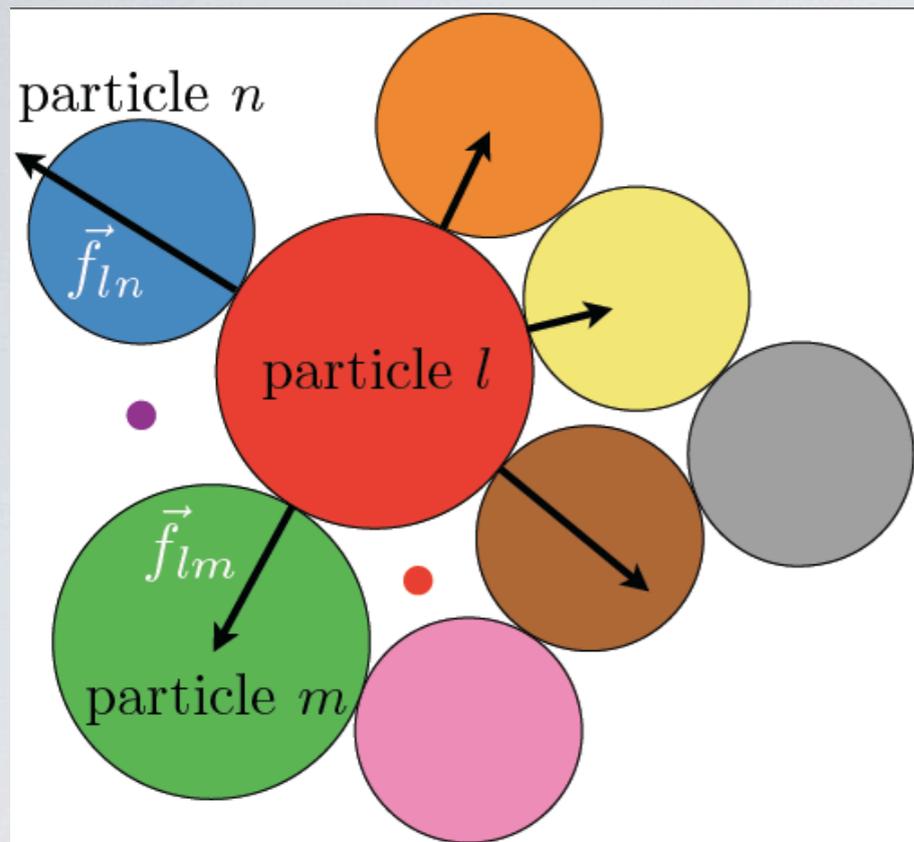
$\underbrace{\hspace{10em}}_0 \qquad \underbrace{\hspace{10em}}_0$

**The conditions of mechanical equilibrium ensure the uniqueness of the height representation**

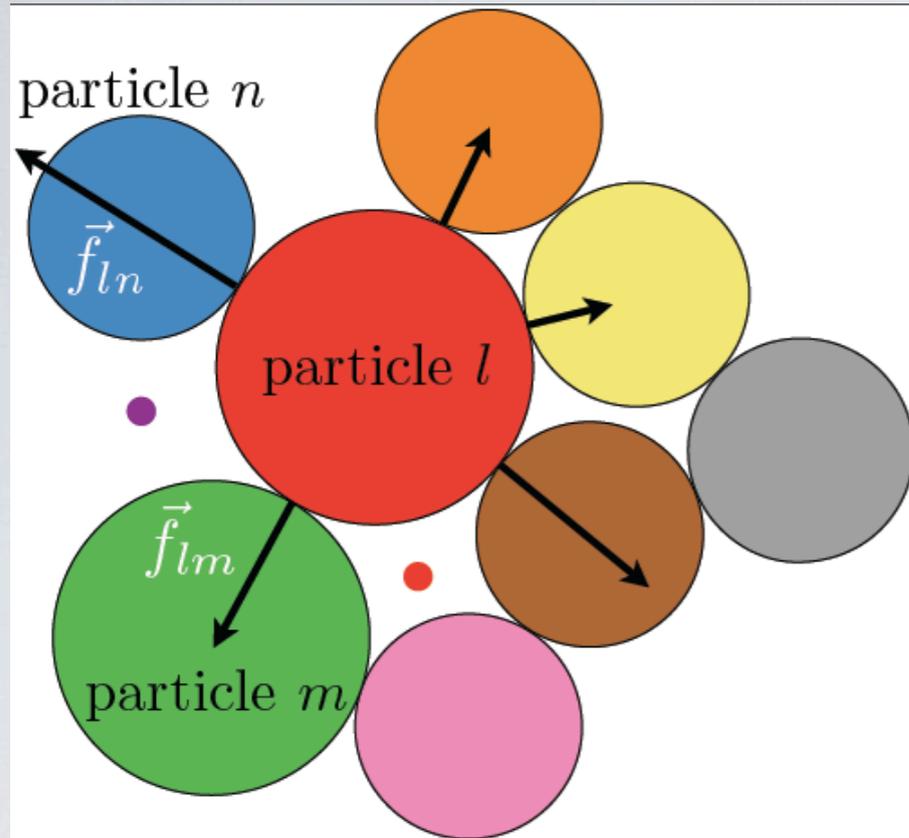
$$\nabla \cdot \hat{\sigma} = 0 \rightarrow \text{Vector potential}$$

**The heights live on a random network**

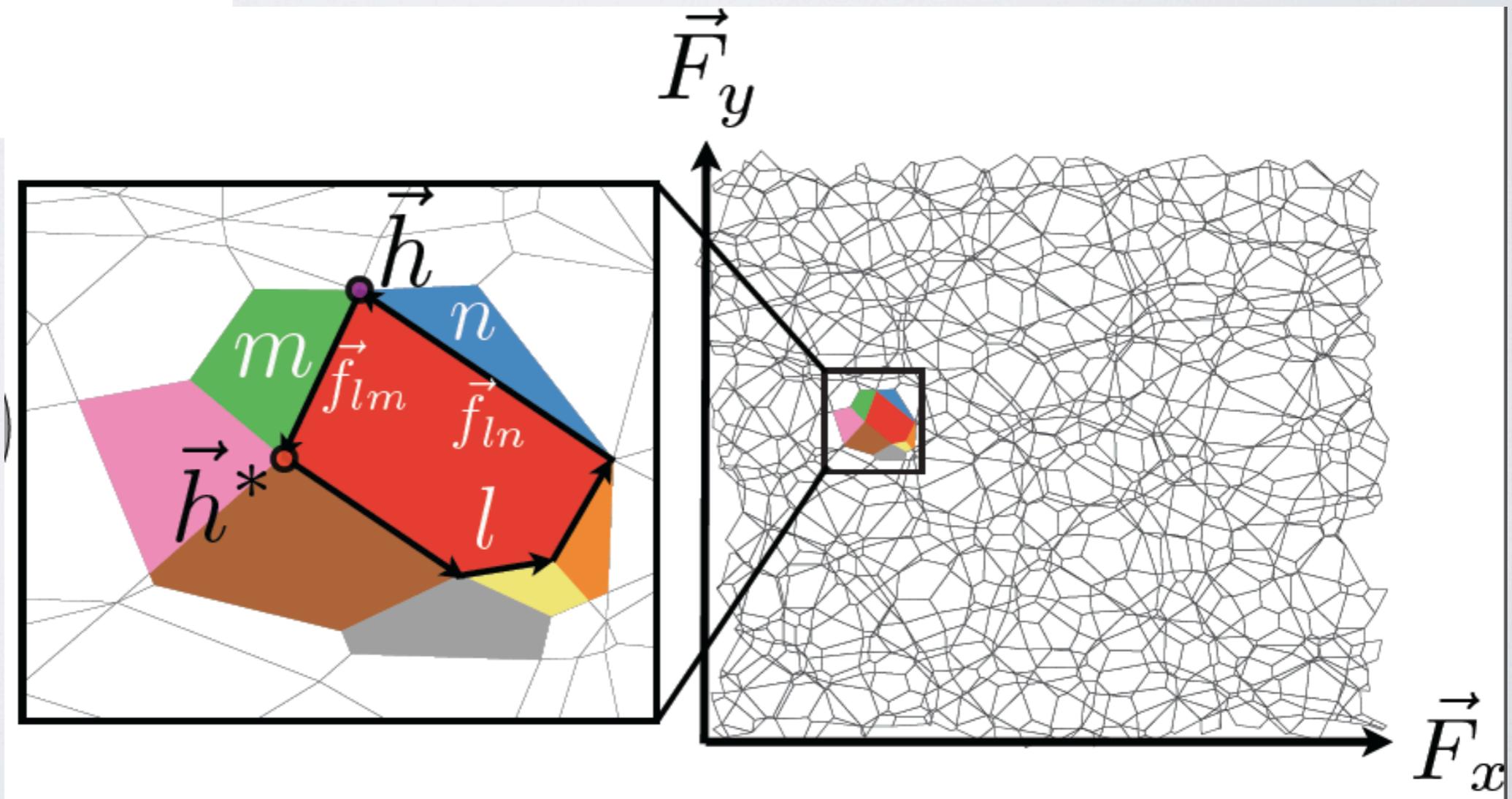
# Force Tilings



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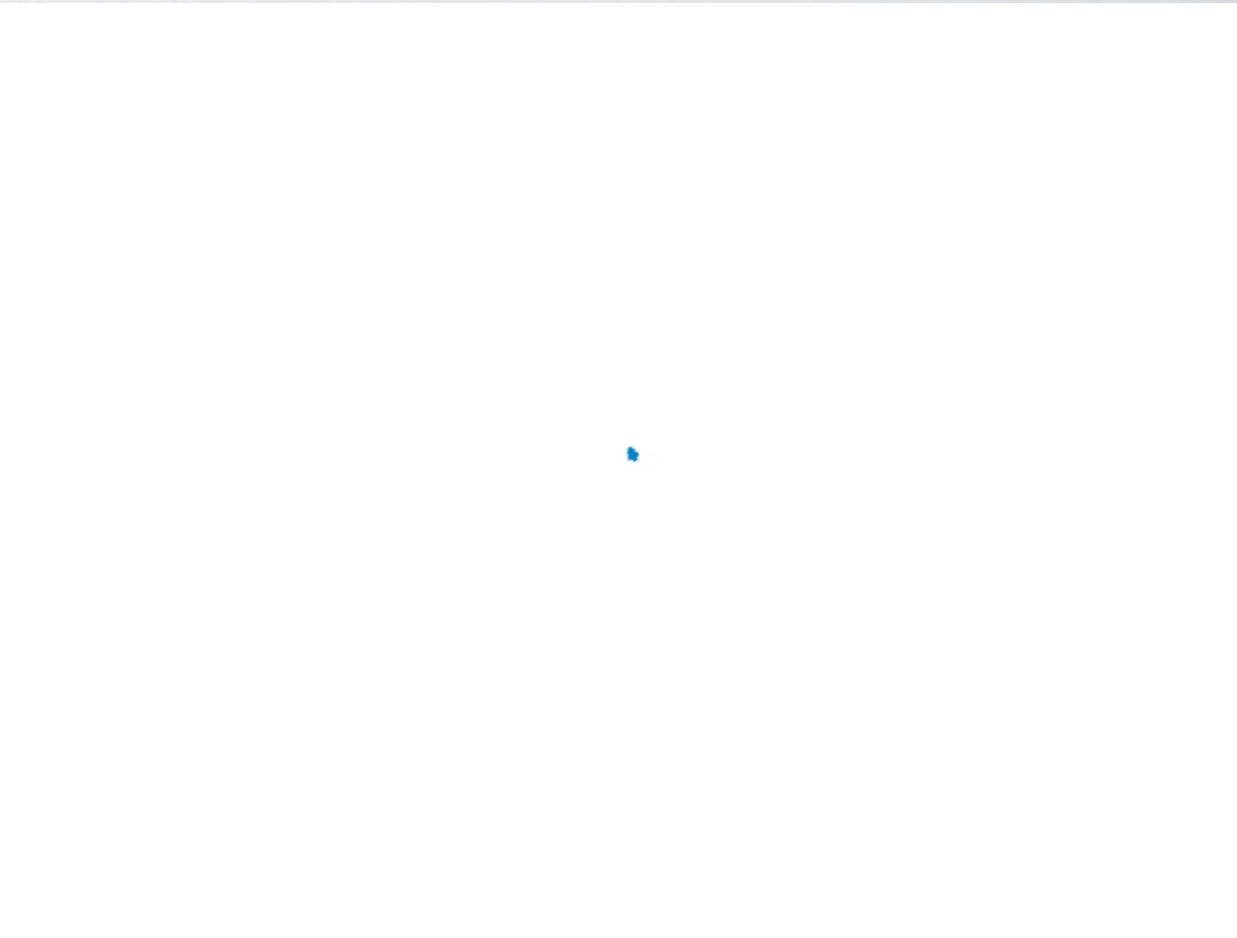
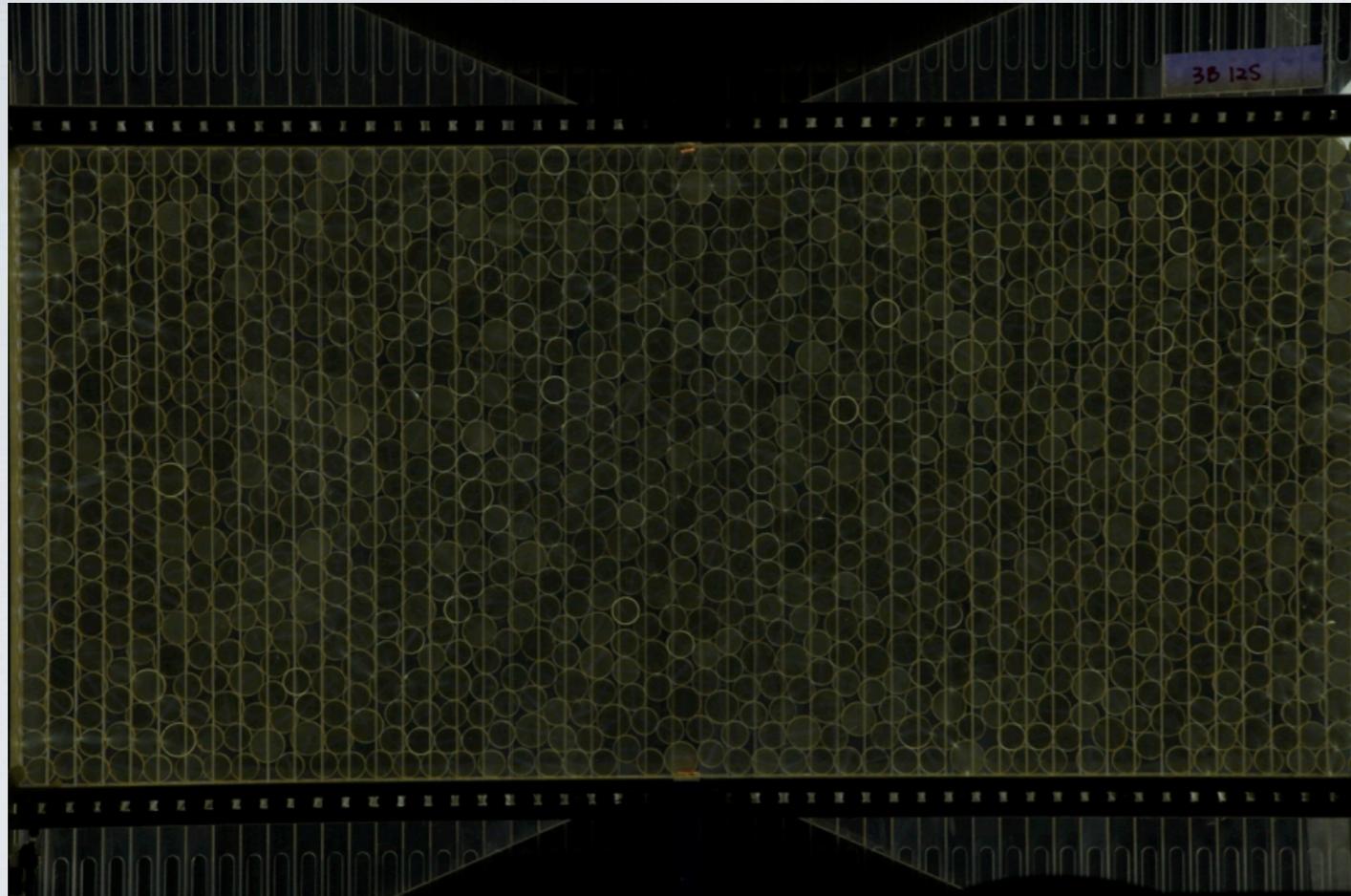


For systems where all normal forces are repulsive, we have a single sheet

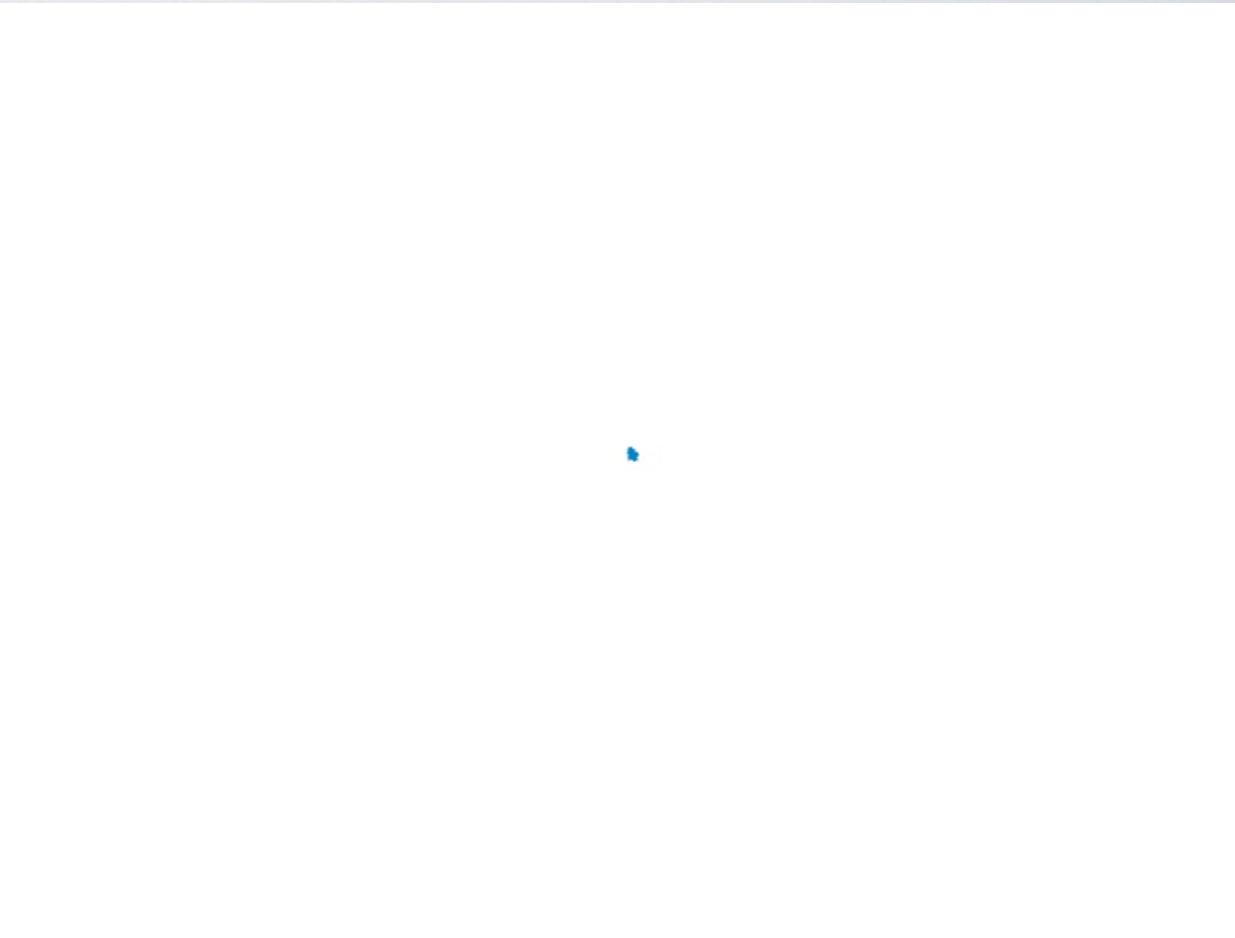
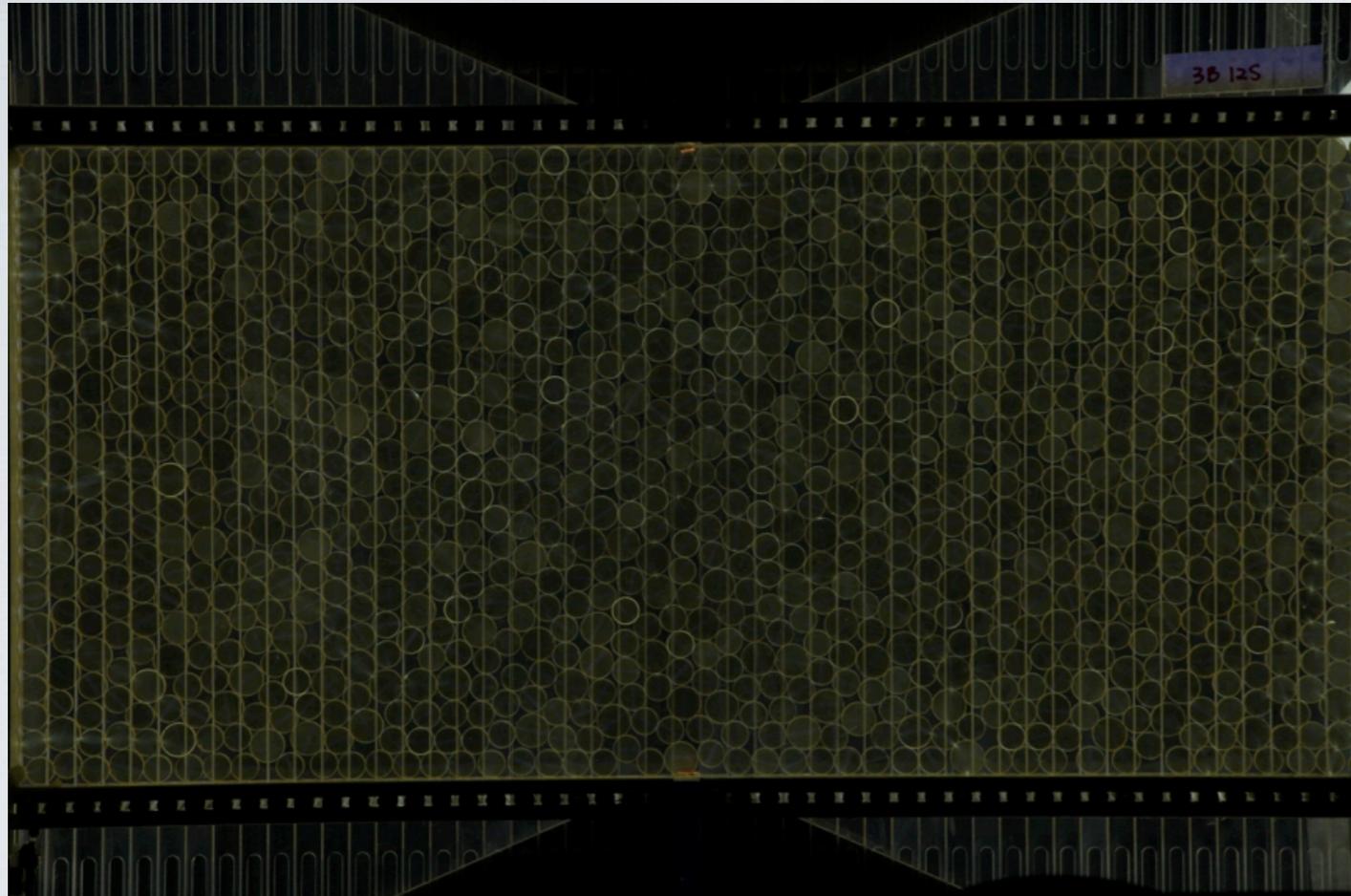


# TWO REPRESENTATIONS

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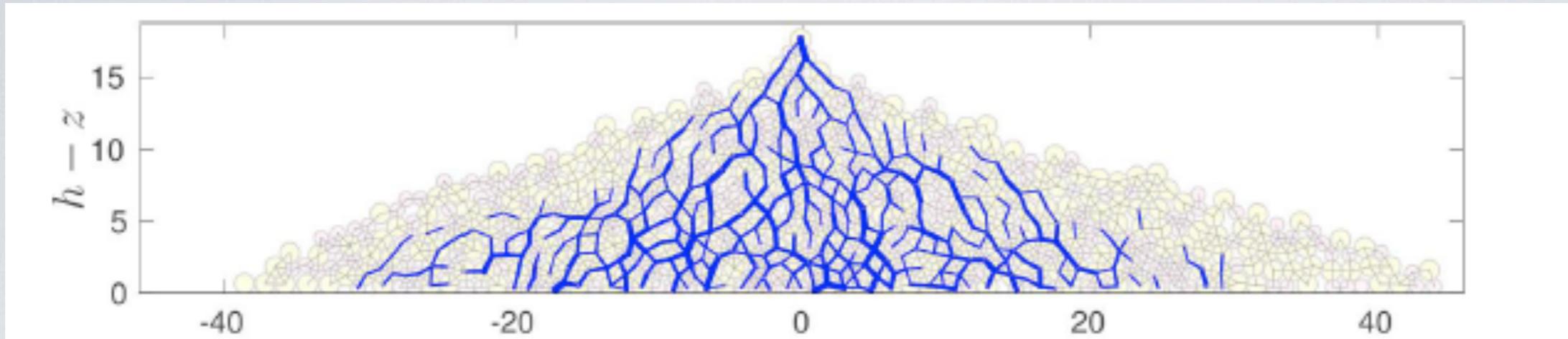
# TWO REPRESENTATIONS



<http://www.aps.org/meetings/march/vpr/2015/videogallery/index.cfm>

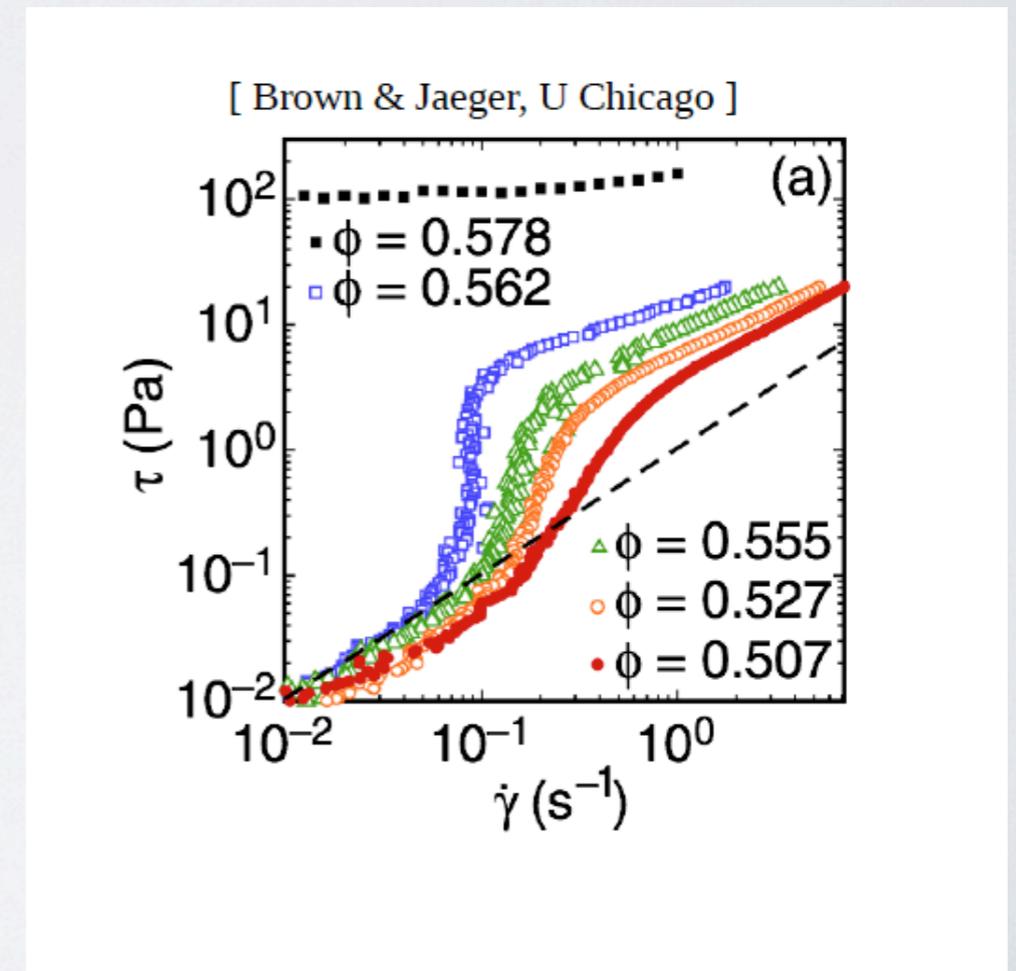
# Two problems:

## • Stress Transmission in Static Granular Aggregates



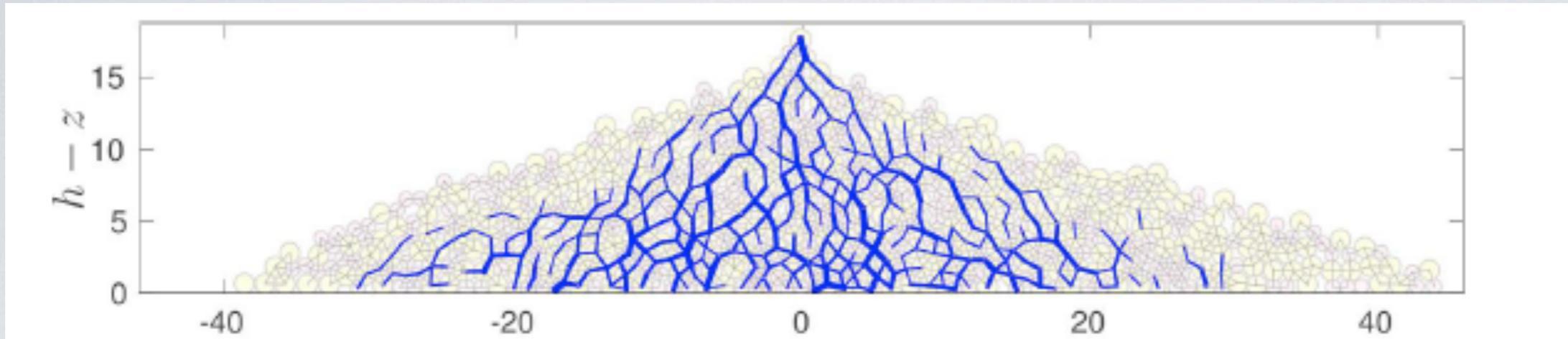
Procaccia group: Numerical Simulations (2016)

## • Discontinuous Shear Thickening in Dense Suspensions



## Two problems:

- **Stress Transmission in Static Granular Aggregates**



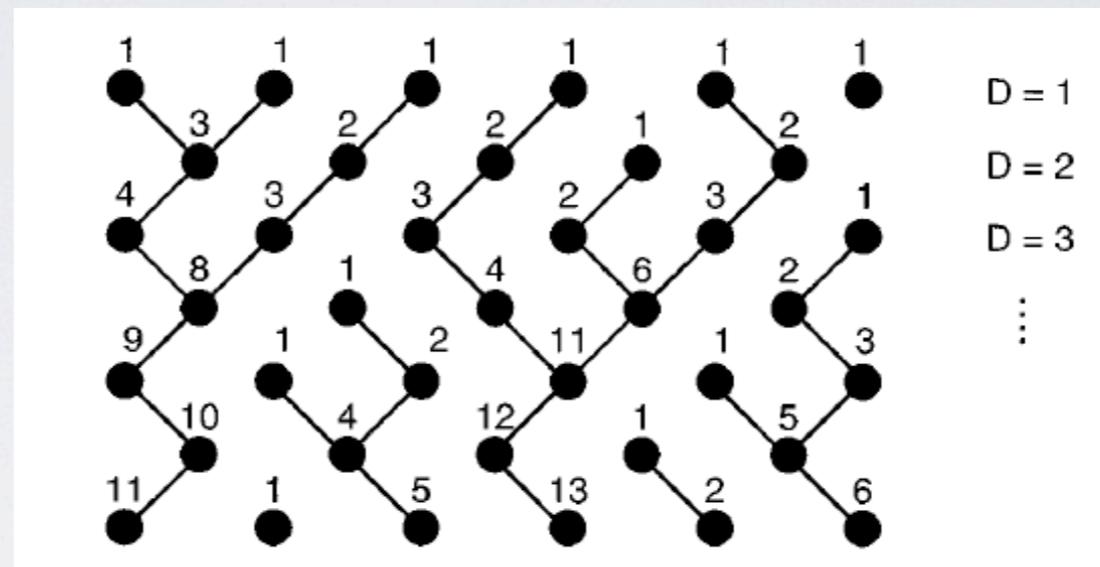
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- **Discontinuous Shear Thickening  
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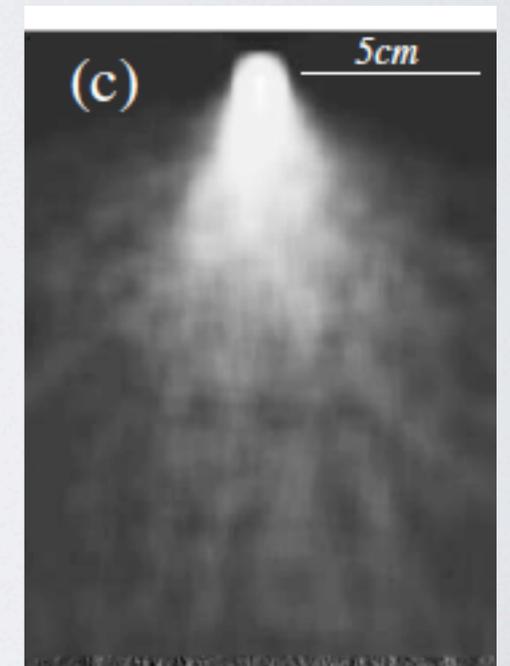
# Theoretical Models

q-model (Coppersmith et al (1996)): Scalar force balance on an ordered network. Disorder incorporated at contacts: how forces get transmitted at contacts. In continuum, reduces to the diffusion equation.

Broad distribution of forces.



In response to a localized force at the top of a pile, the pressure profile at the bottom has a peak with width proportional to the square root of the height.



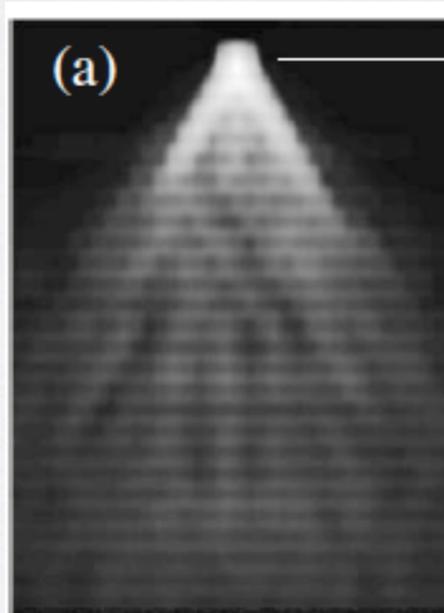
# Theoretical Models

Missing stress-geometry equation: no well defined strain field/compatibility relations

Continuum models with prescribed constitutive law relating stress components. determined by history of preparation. For example,

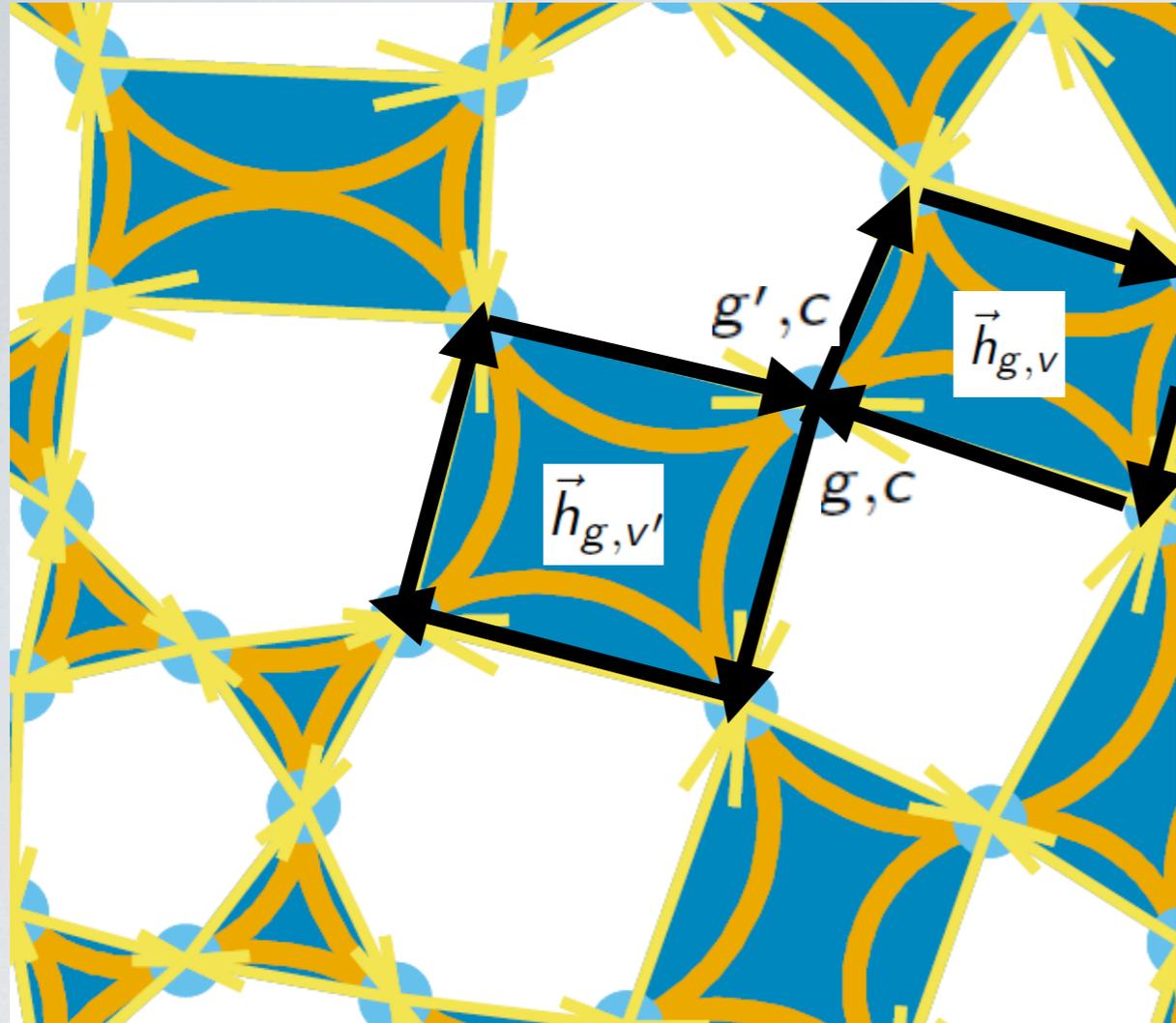
$$\sigma_{zz} = c_0^2 \sigma_{xx}$$

More elaborate closure relations: (Review: J.-P. Bouchaud Les Houches Lectures)



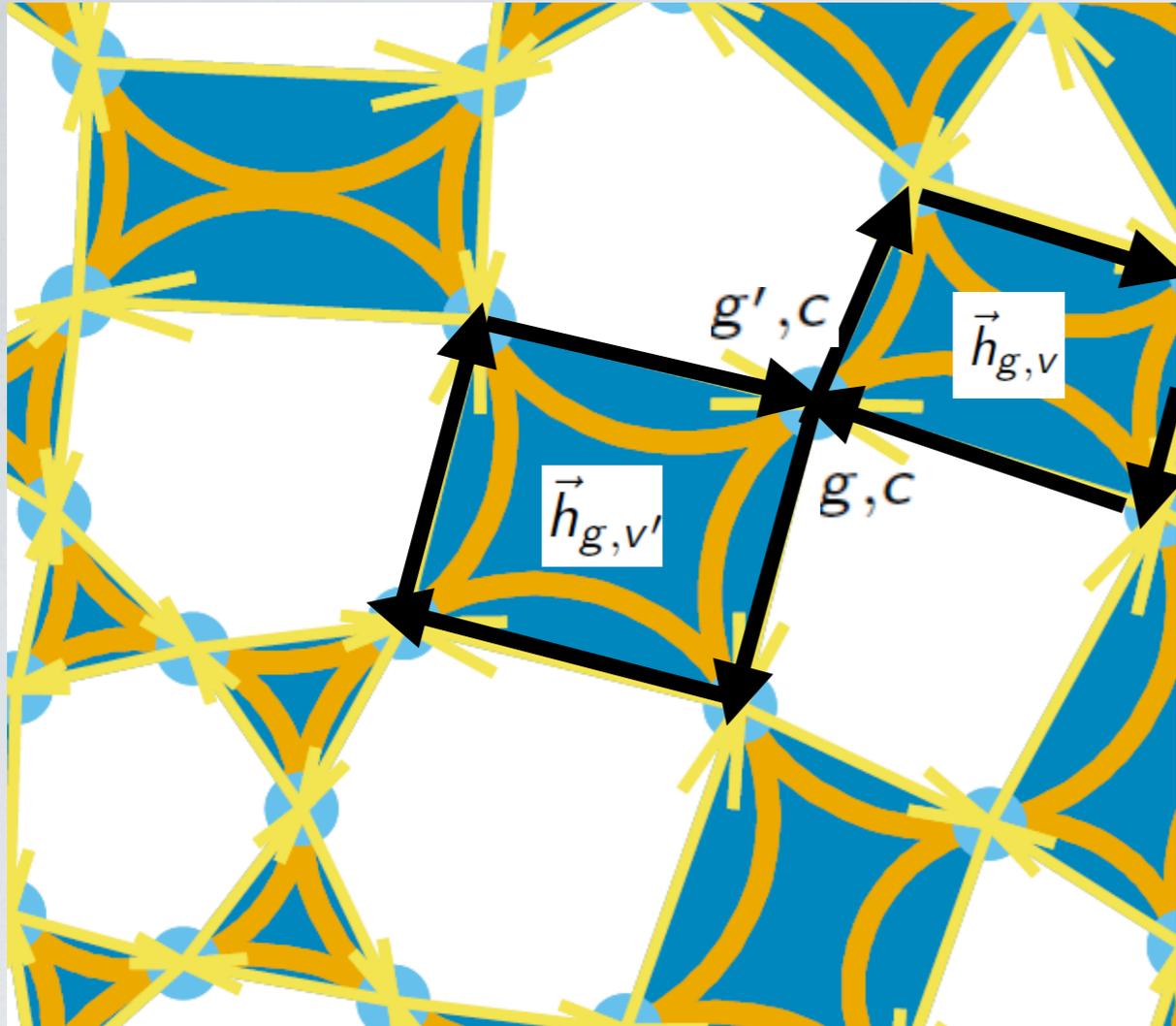
Stresses propagate/ get transmitted along lines

# Force Response of a network to a perturbation



$$\begin{aligned} \vec{f}_{g, c_1} &\neq \vec{h}_{g, v_1} - \vec{h}_{g, v_2}, \\ \vec{f}_{g, c_2} &\neq \vec{h}_{g, v_2} - \vec{h}_{g, v_3}, \\ \vec{f}_{g, c_3} &\neq \vec{h}_{g, v_3} - \vec{h}_{g, v_4}, \\ \underbrace{\vec{f}_{g, c_4}}_0 &\neq \underbrace{\vec{h}_{g, v_4} - \vec{h}_{g, v_1}}_0. \end{aligned}$$

# Force Response of a network to a perturbation



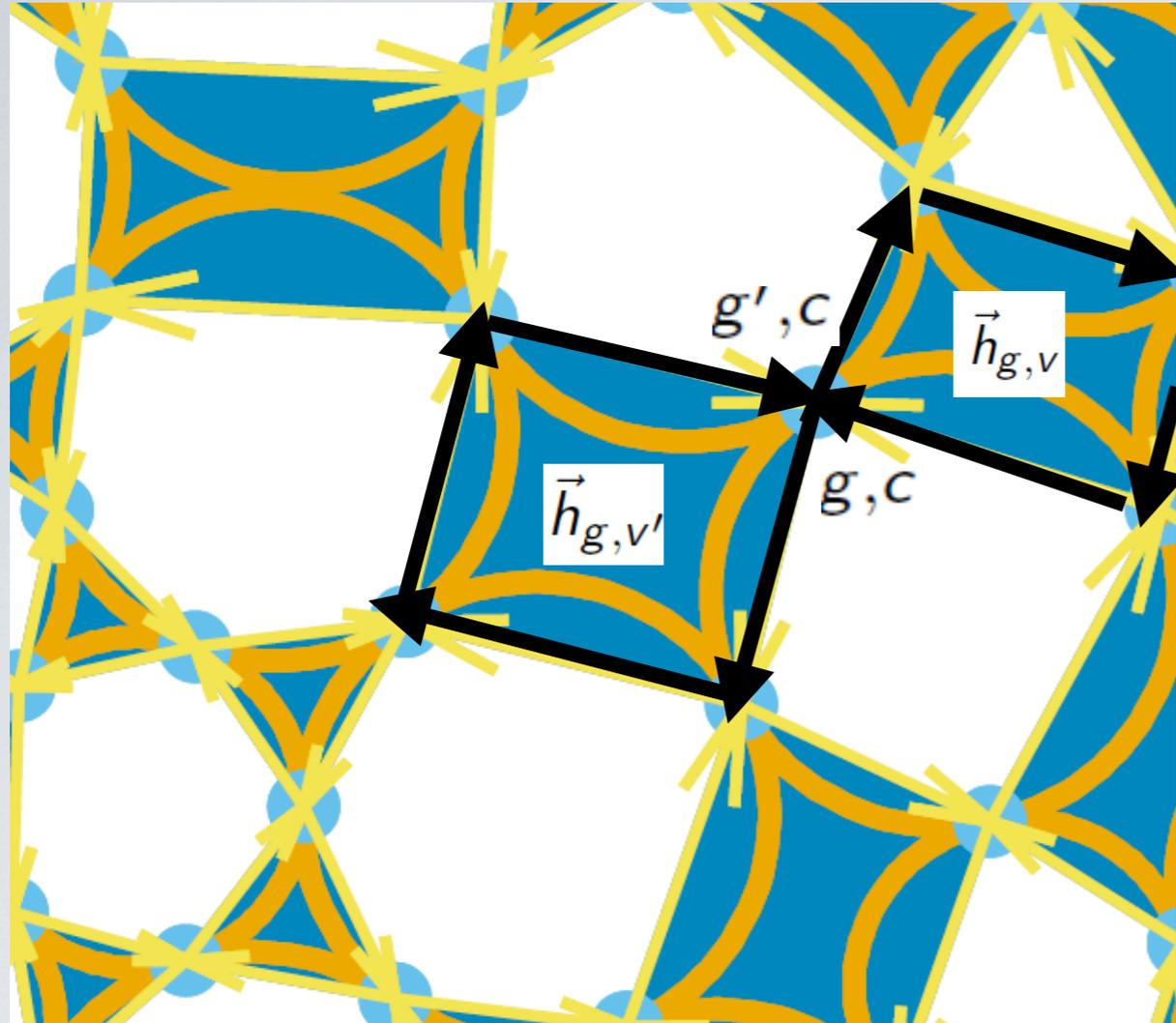
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$\underbrace{\hspace{10em}}_0 \qquad \underbrace{\hspace{10em}}_0$

$$\begin{aligned}\vec{f}_{g,c1} &= \vec{h}_{g,v1} - \vec{h}_{g,v2} + \vec{\phi}_{g1} - \vec{\phi}_{g0}, \\ \vec{f}_{g,c2} &= \vec{h}_{g,v2} - \vec{h}_{g,v3} + \vec{\phi}_{g2} - \vec{\phi}_{g0}, \\ \vec{f}_{g,c3} &= \vec{h}_{g,v3} - \vec{h}_{g,v4} + \vec{\phi}_{g3} - \vec{\phi}_{g0}, \\ \vec{f}_{g,c4} &= \vec{h}_{g,v4} - \vec{h}_{g,v1} + \vec{\phi}_{g4} - \vec{\phi}_{g0}.\end{aligned}$$

$\underbrace{\hspace{10em}}_{-\vec{f}_g^{body}} \qquad \underbrace{\hspace{10em}}_0 \qquad \underbrace{\hspace{10em}}_{\square^2 \vec{\phi}_0}$

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 \end{aligned}$$

Geometry of contact network represented by the network Laplacian

Random matrix: diagonal elements contain the number of contacts, otherwise the adjacency matrix

$$\begin{aligned}
 \vec{f}_{g, c_1} &= \vec{h}_{g, v_1} - \vec{h}_{g, v_2} + \vec{\phi}_{g_1} - \vec{\phi}_{g_0}, \\
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# Framework

$$\square^2 |\vec{\phi}\rangle = -|\vec{f}_{body}\rangle$$

Equation defining the auxiliary fields

Given a contact network and a set of body forces, solution is unique

If the solution violates torque balance/static friction condition, network will rearrange

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Disorder of contact network represented by network Laplacian

Diffusion on a random network: Localization ?

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Diffusion on a random network: Localization ?

Eigenfunction expansion  $\square^2 = \sum_{i=1}^N \lambda_i |\lambda_i\rangle \langle \lambda_i|$

One zero mode  $\lambda_1 = 0$  ,  $|\lambda_1\rangle = (1 \ 1 \ 1 \dots 1)$

Localized ?  $|\vec{\phi}\rangle = \sum_{i=1}^N \frac{1}{\lambda_i} \langle \lambda_i | \vec{f}_{body} \rangle |\lambda_i\rangle$

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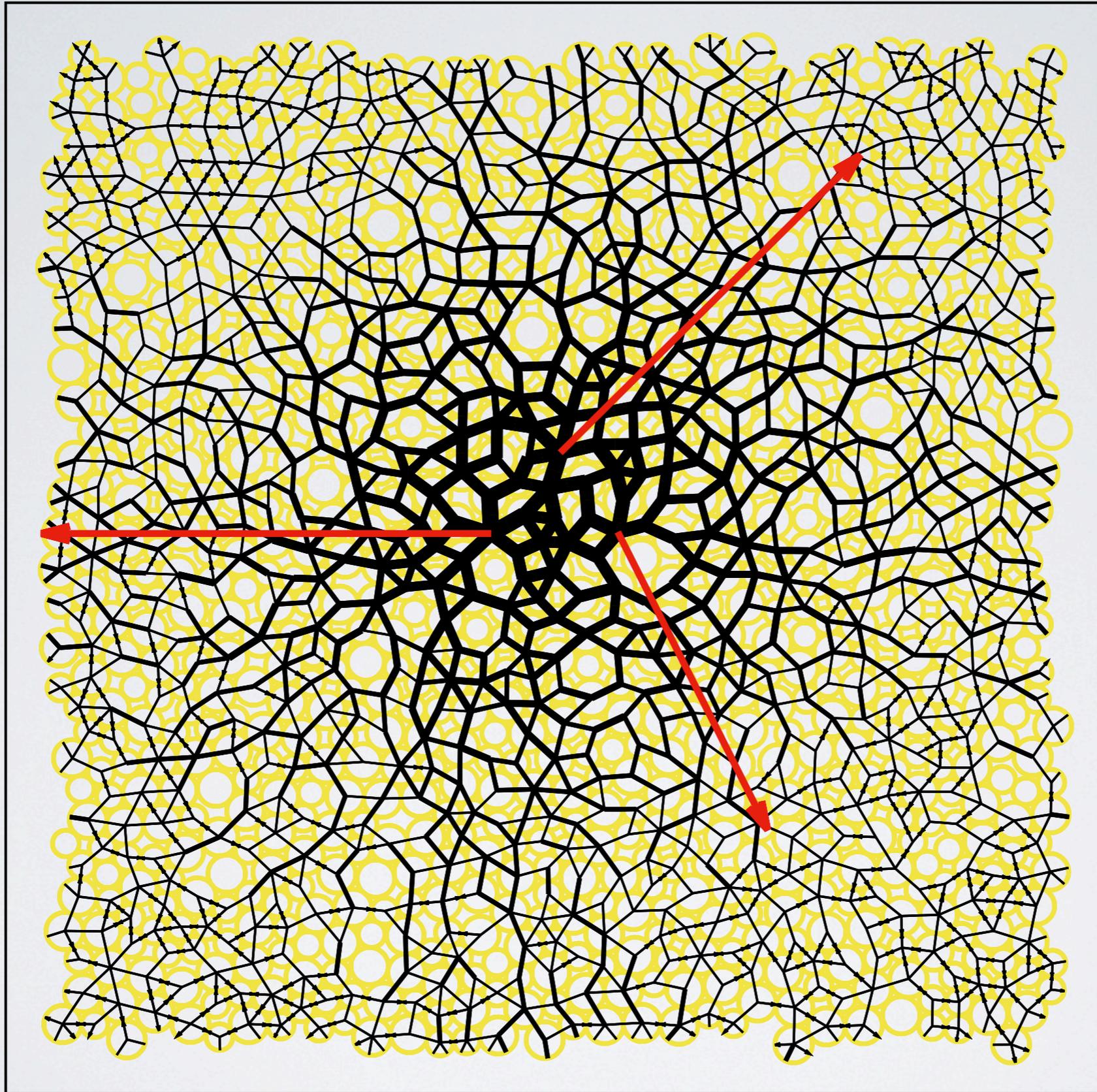
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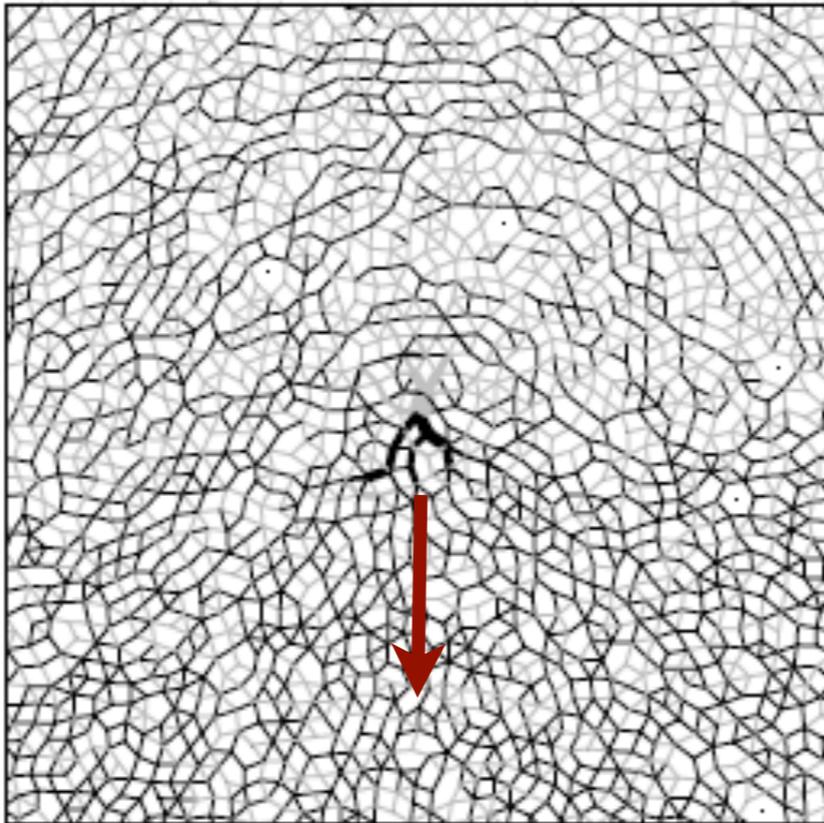
Different from q model: On a given contact network, how the force perturbation gets distributed among contacts is completely determined by the constraints of force balance

Constitutive Law determined by statistical properties of the ensemble of Laplacians

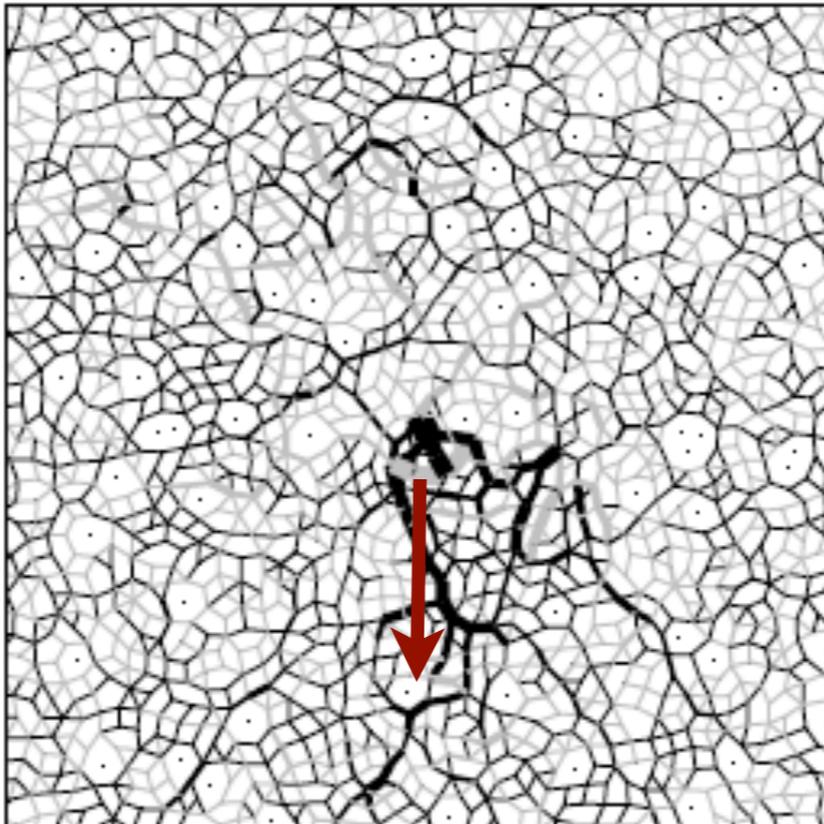
## Response of a frictionless granular solid



**Simulation Results:  
Ellenbroek, Somfai, &  
van Saarloos**



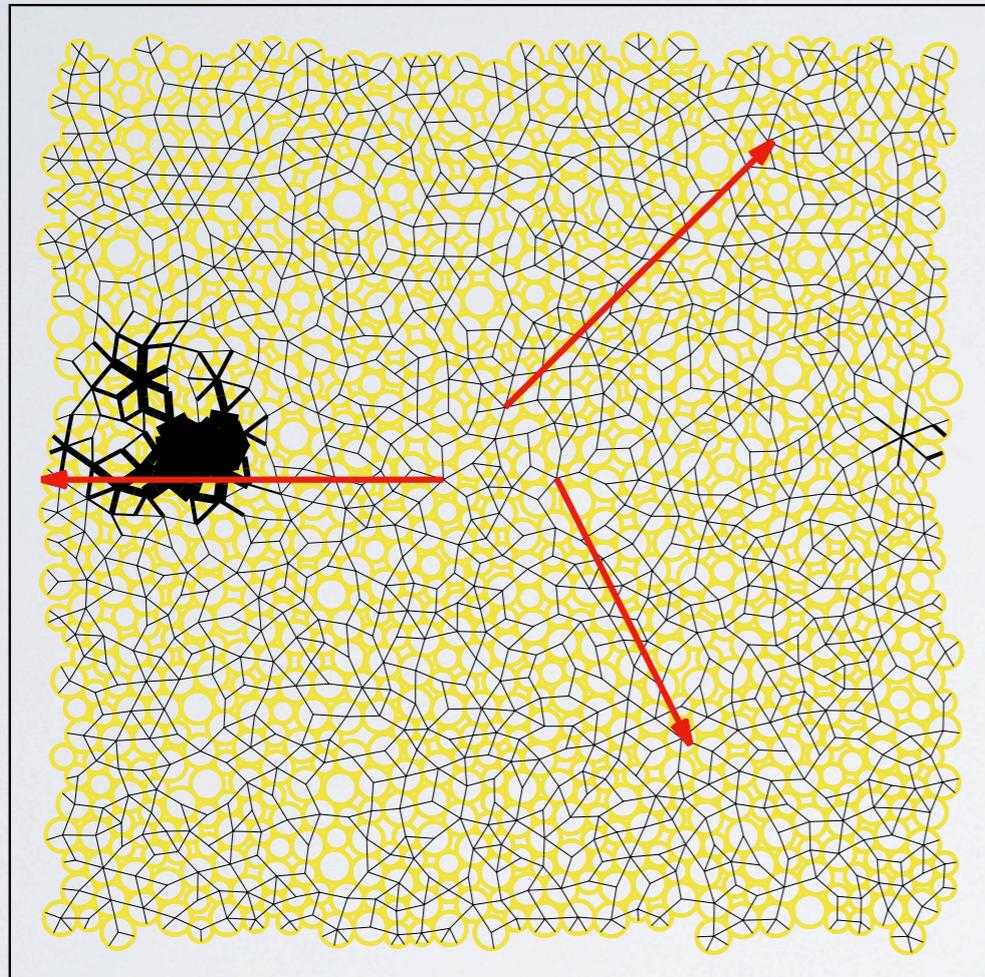
Higher compression



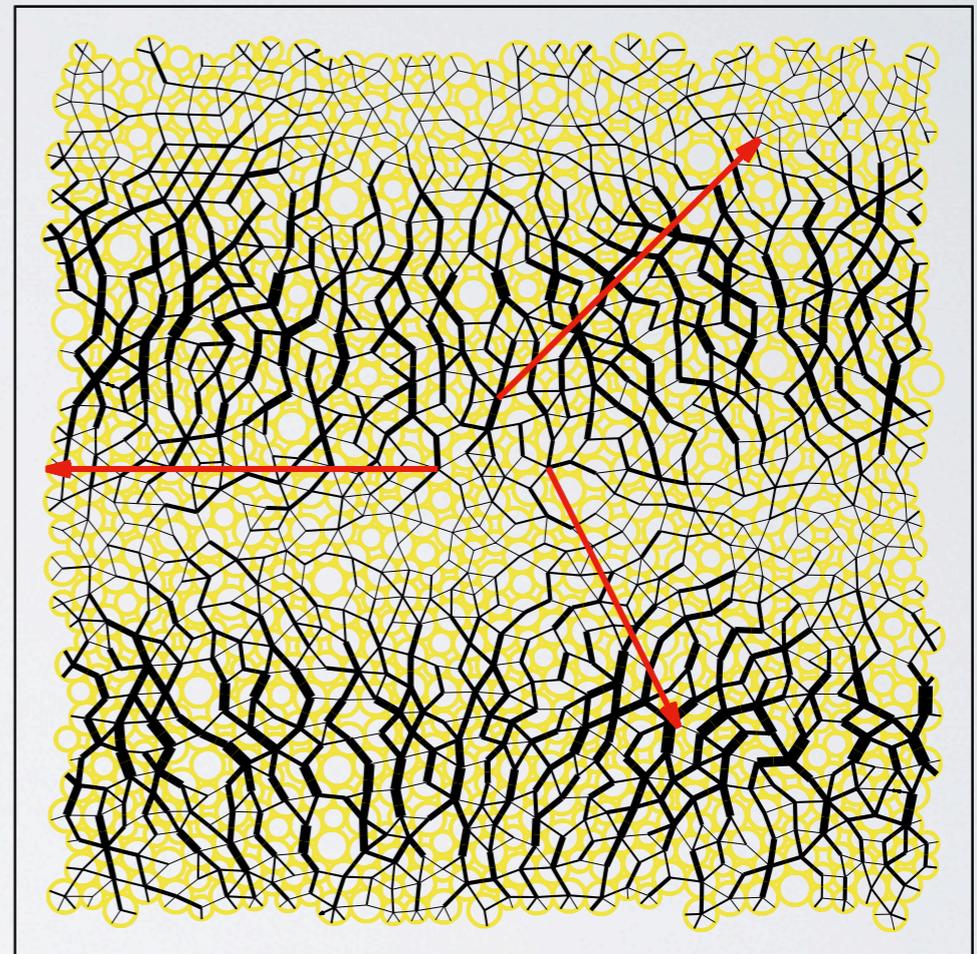
Lower compression

Response spreading  
over larger distances at  
lower compression ?

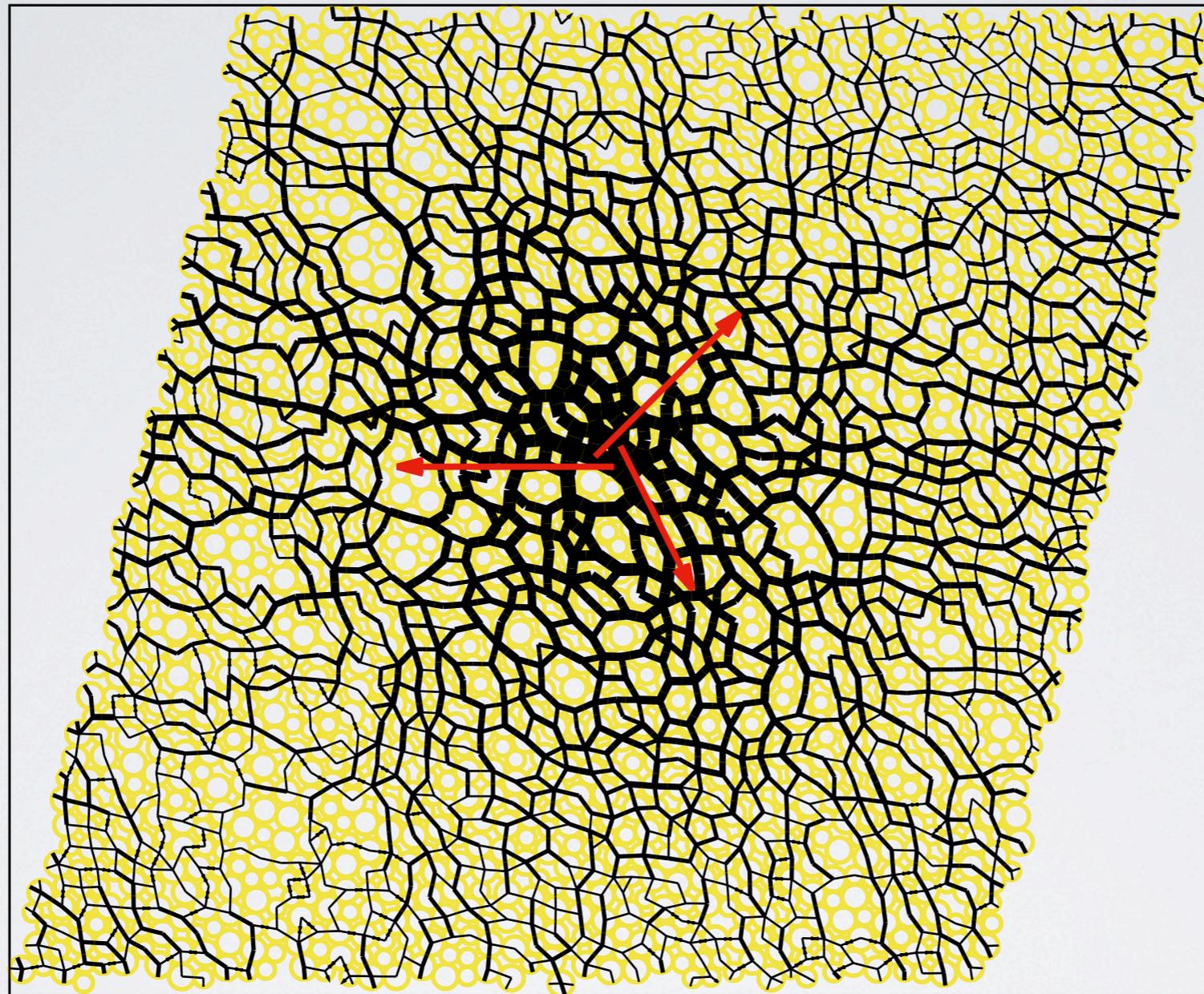
Highest eigenvalue:  
strongly localized



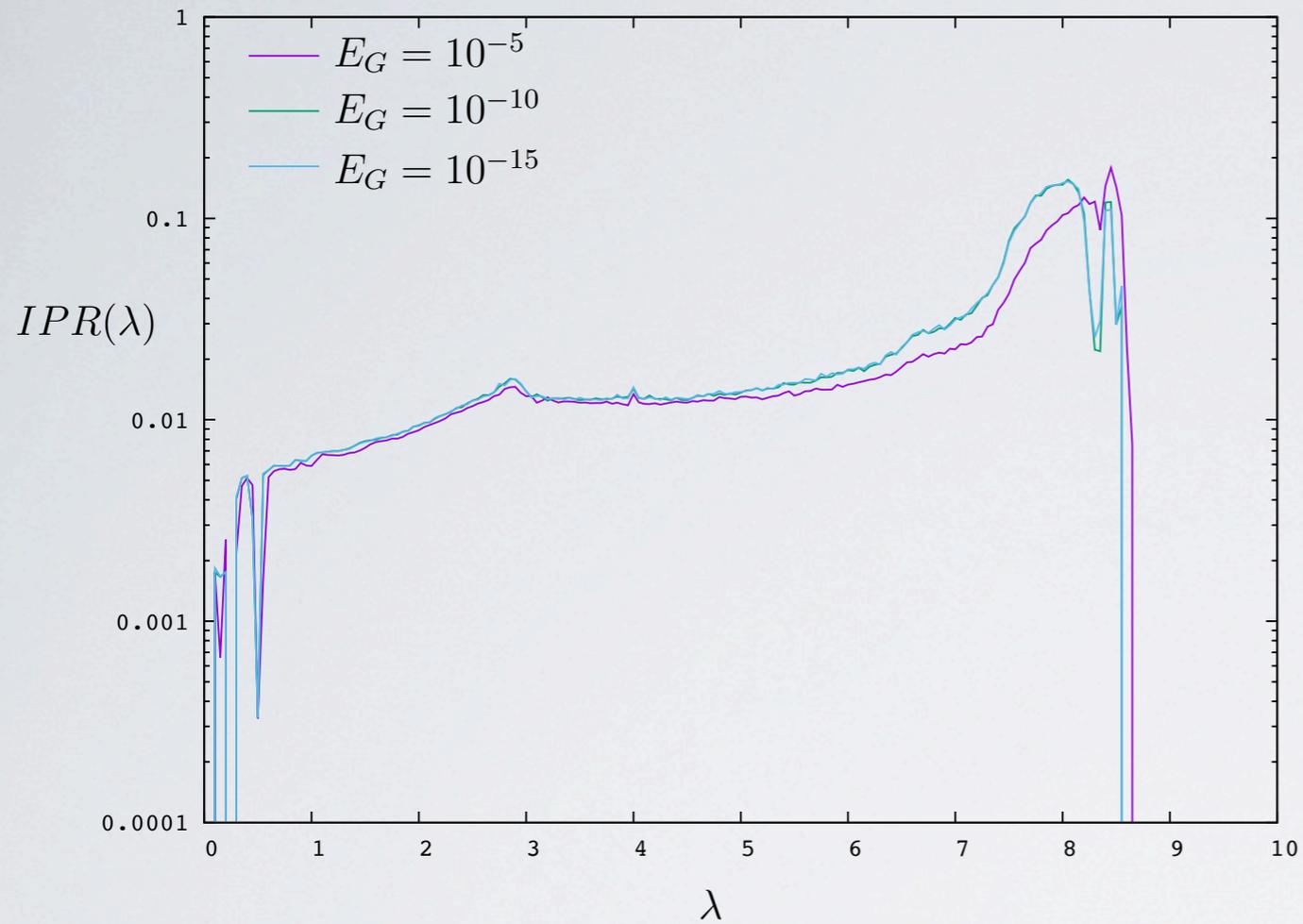
Lowest eigenvalue:  
delocalized



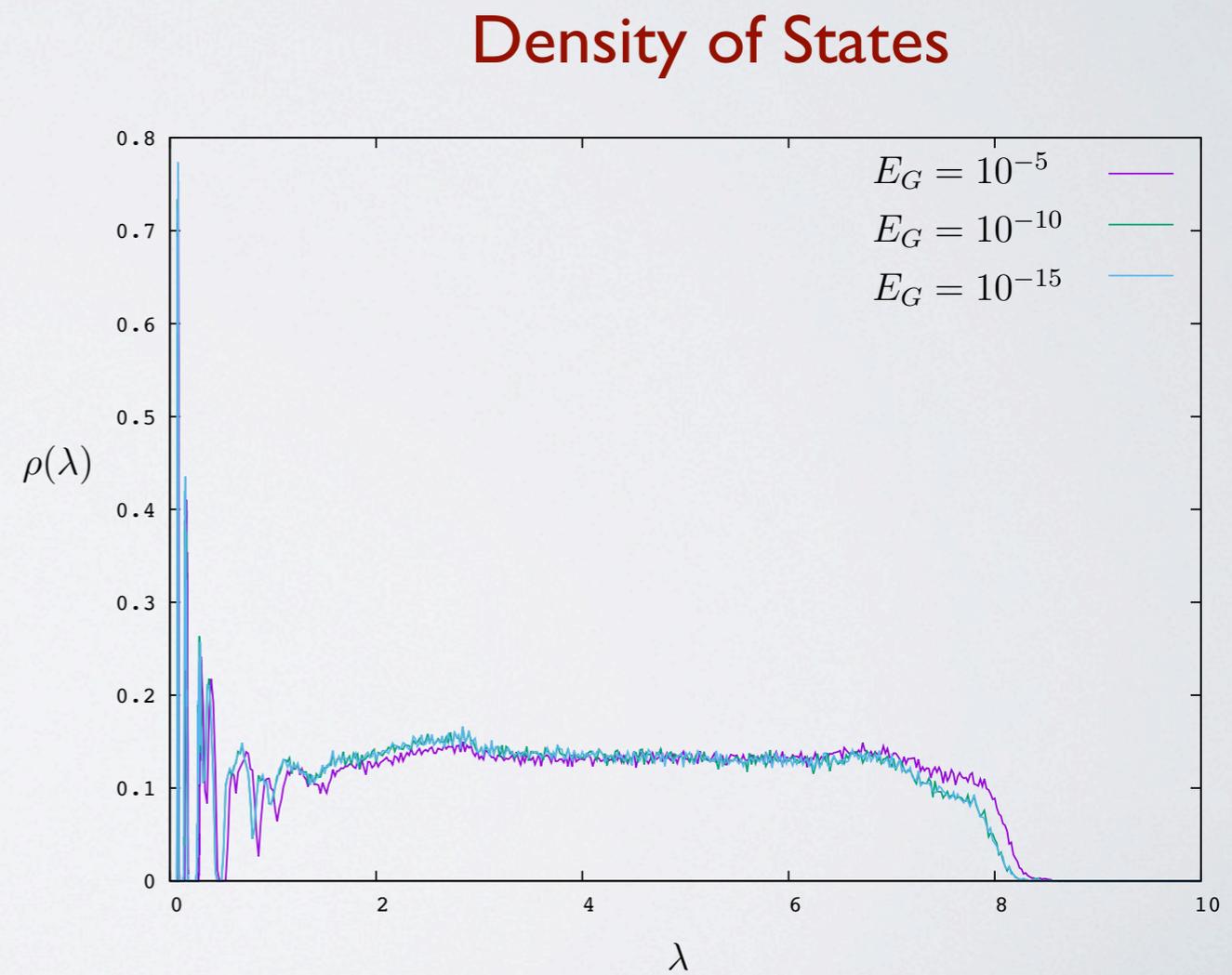
# Response of a sheared, frictional granular solid



# Ensemble average: Spectral properties



Inverse Participation Ratio



Density of States

# Stress Localization

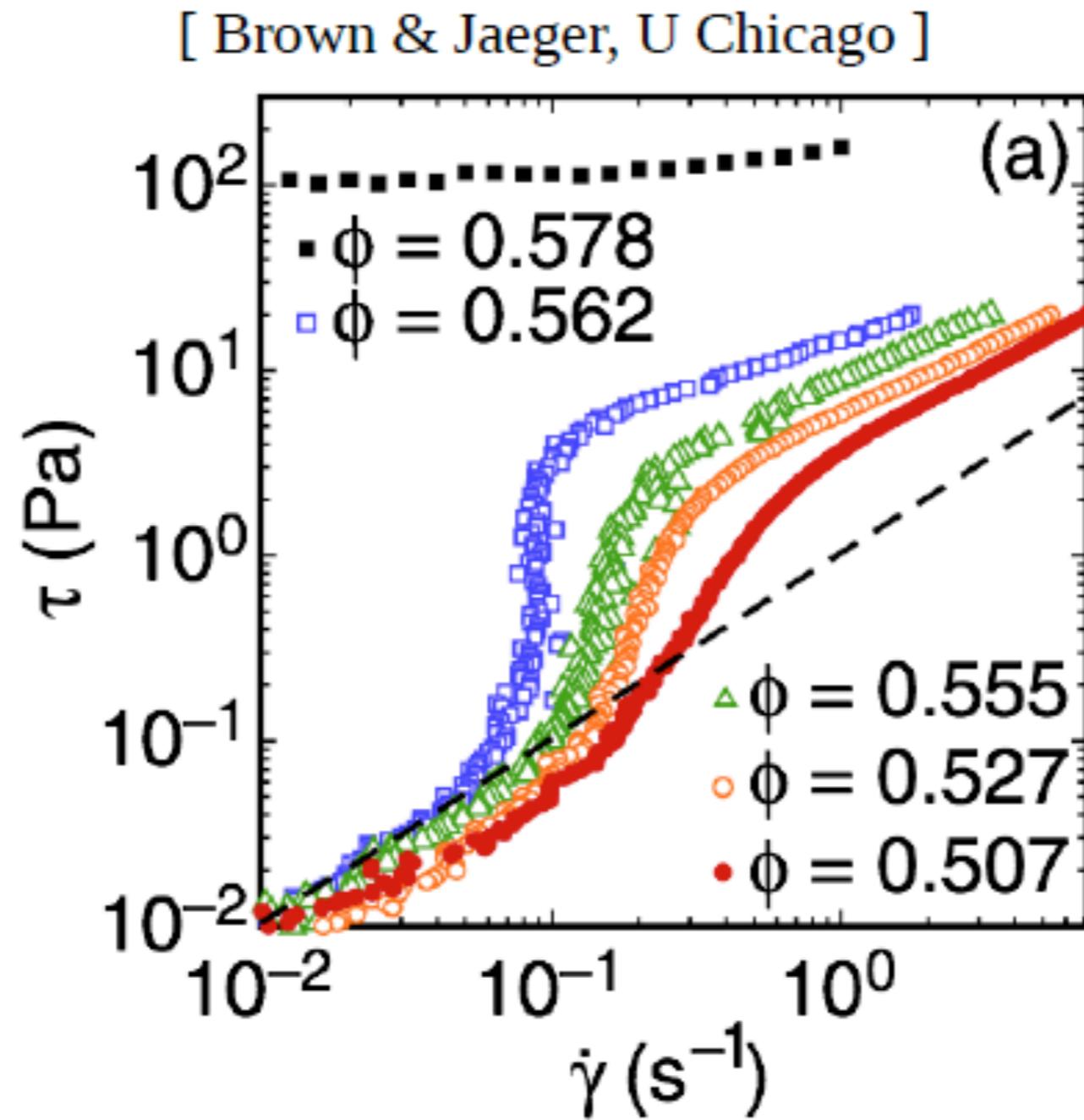
- Maps granular response problem to the localization problem

“Absence of Diffusion in Certain Random Lattices”

P.W.Anderson (1958)

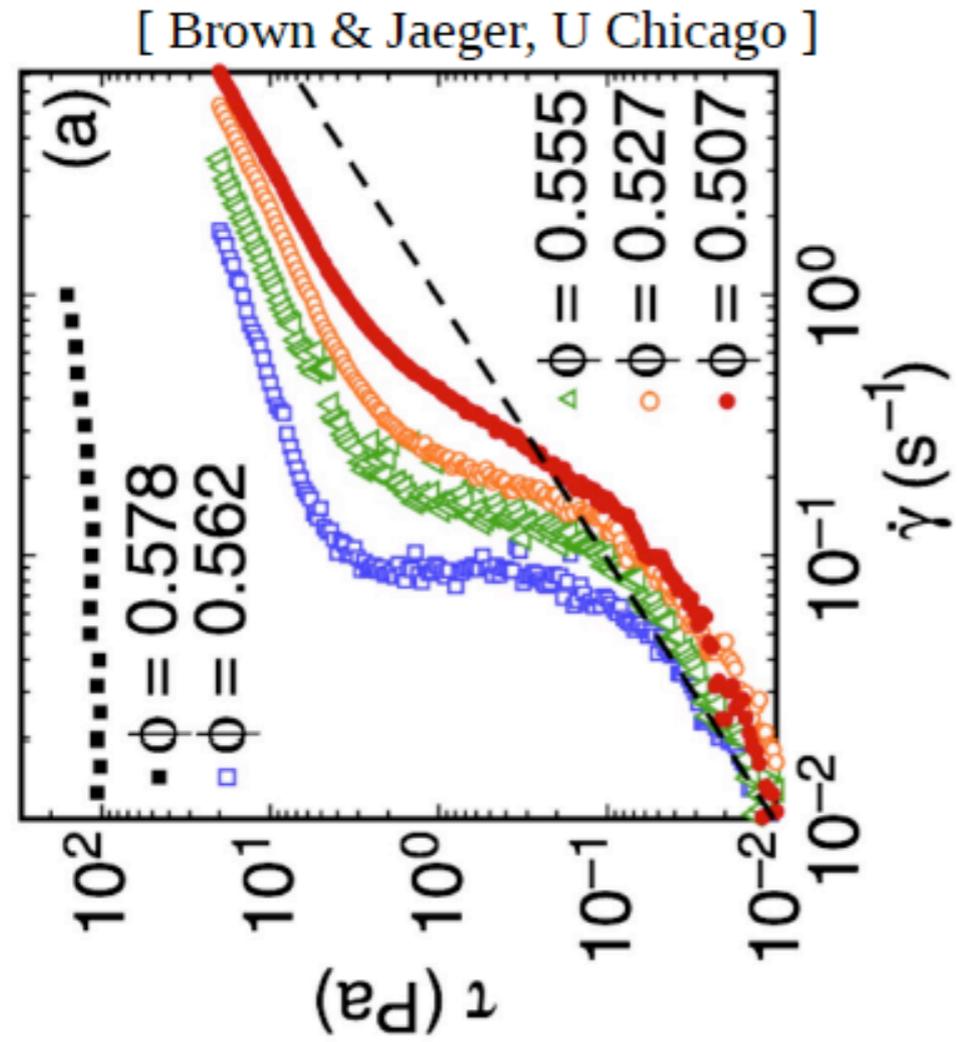
- Theory relates response to the disorder in the underlying network
- Random Matrix Ensemble: Characterizing Jammed Networks
- Disorder in underlying network is probably correlated

# Discontinuous Shear Thickening

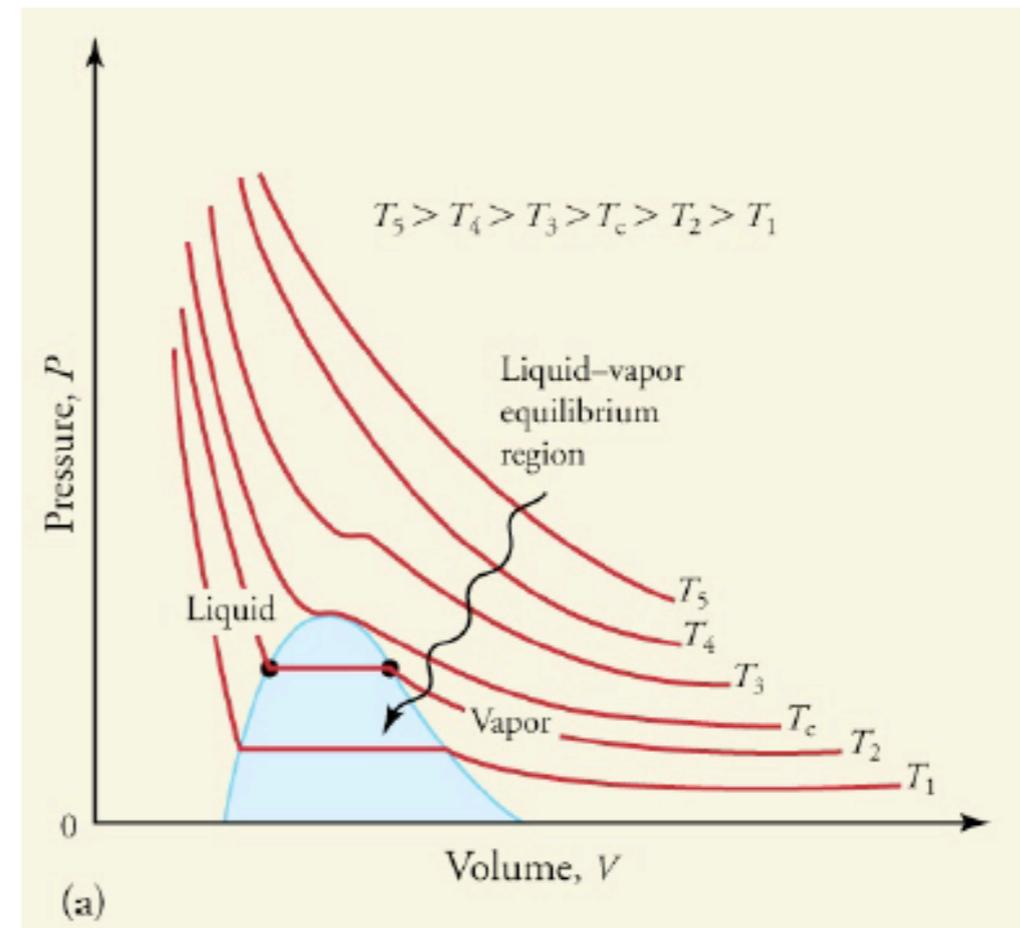
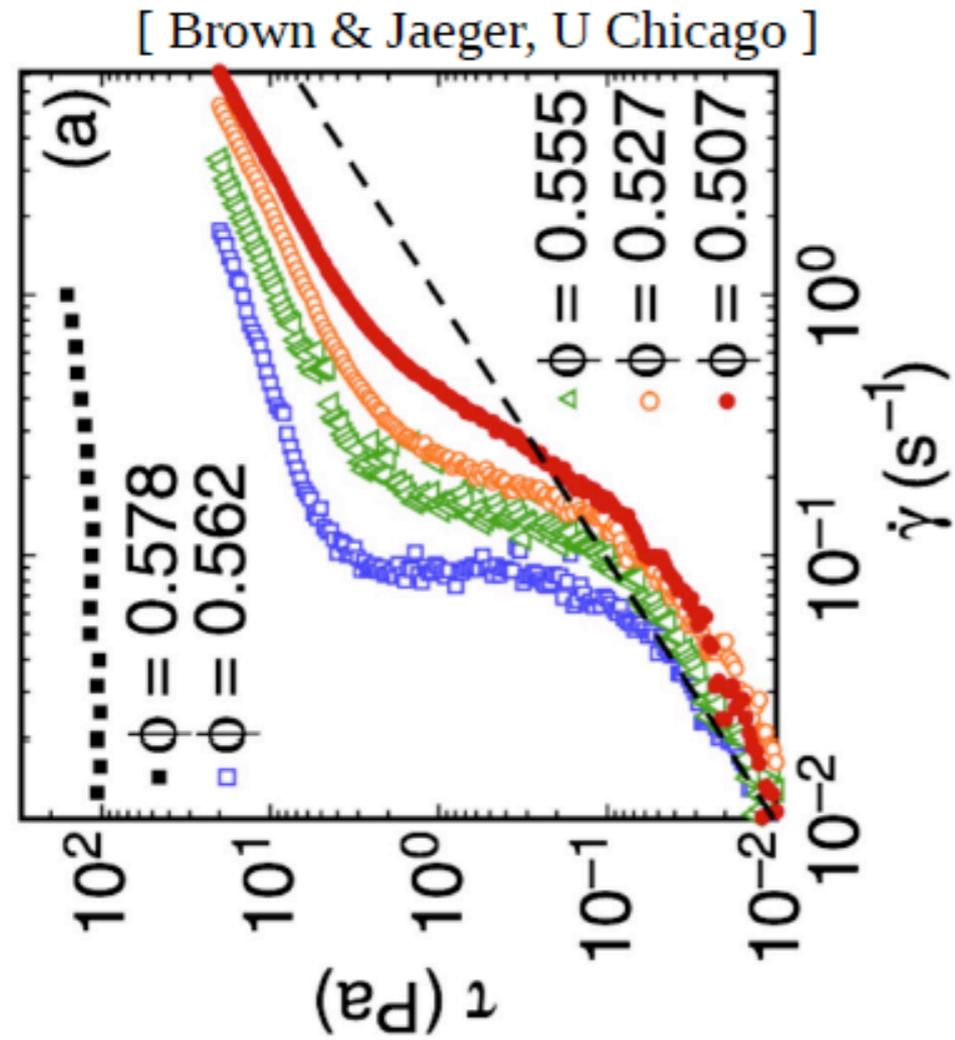


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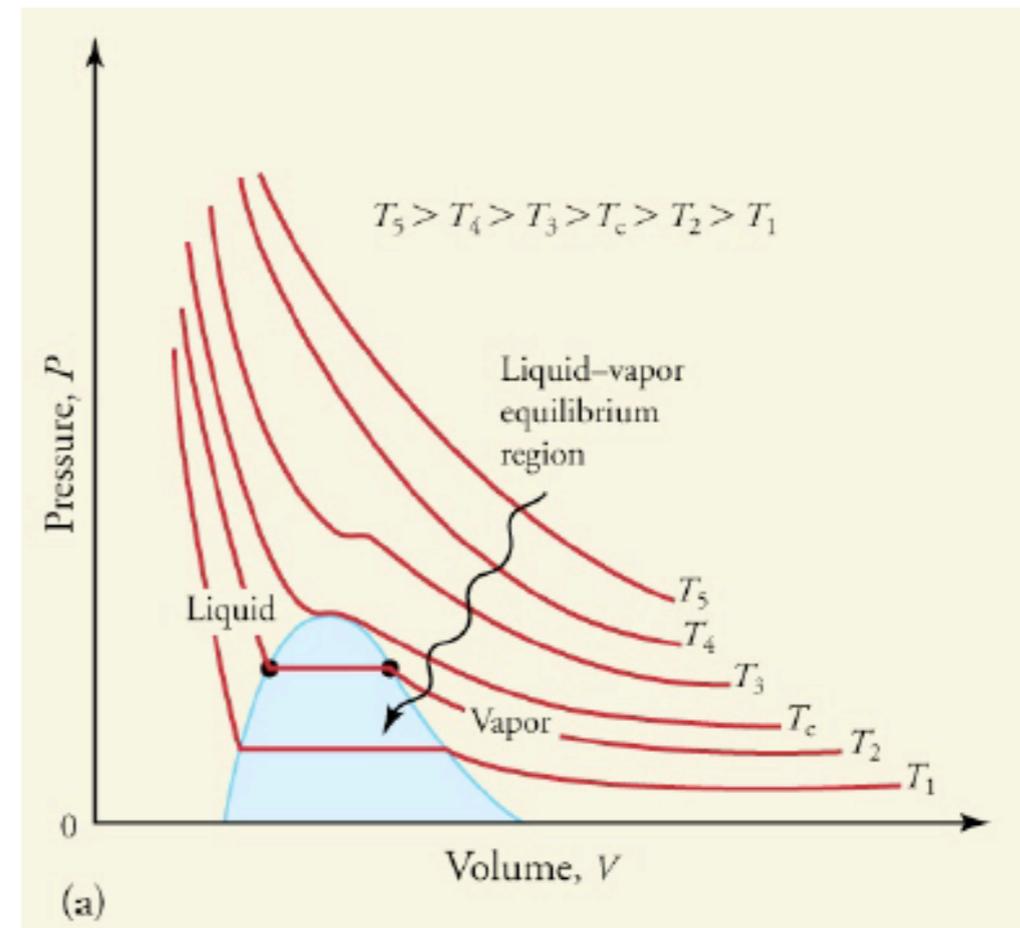
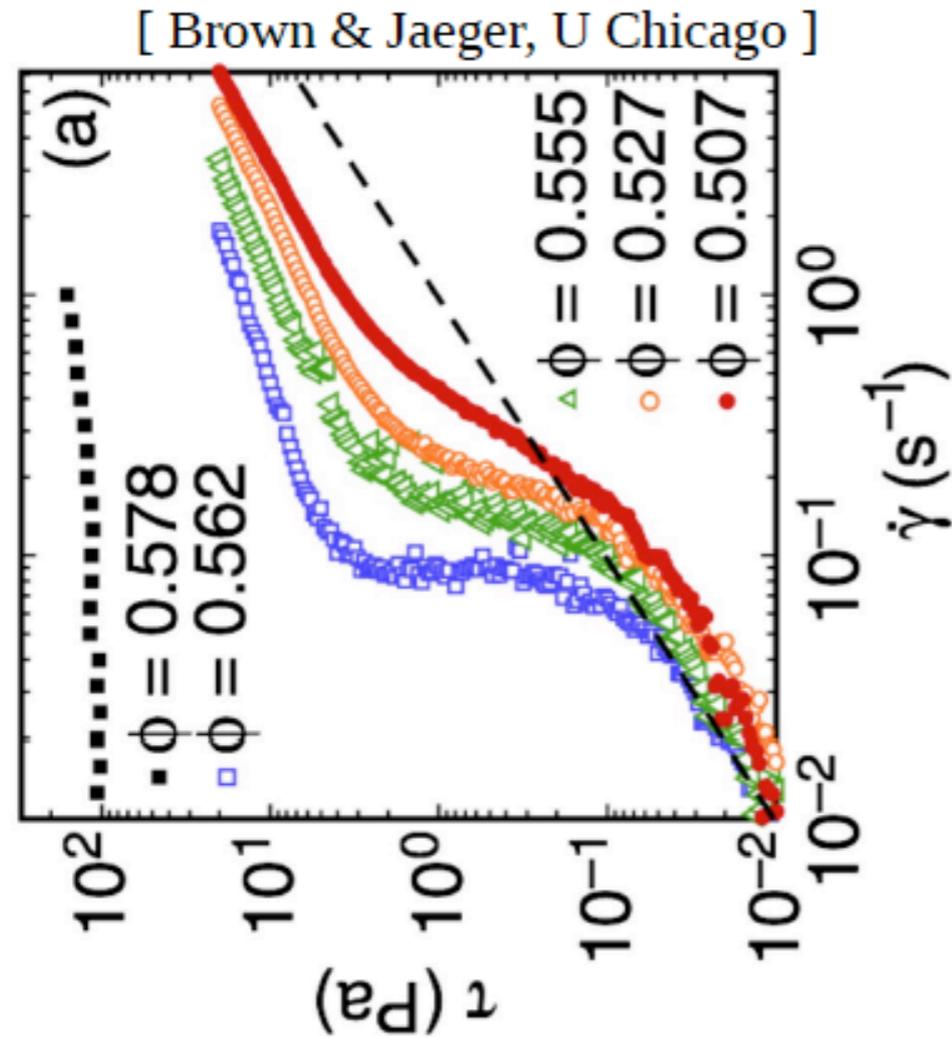
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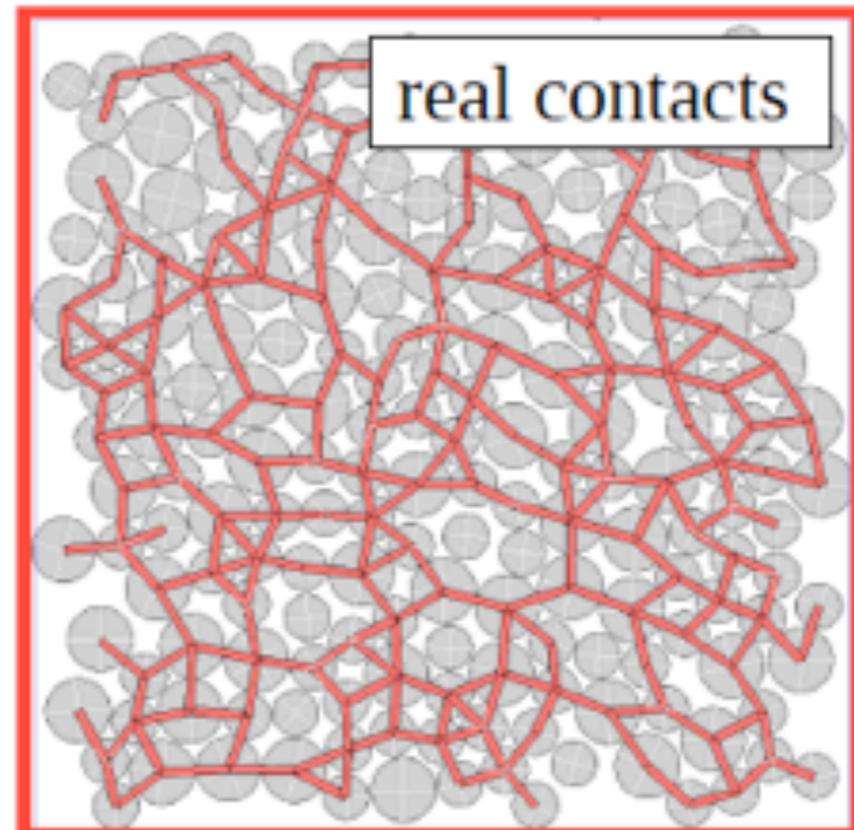
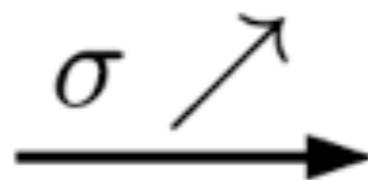
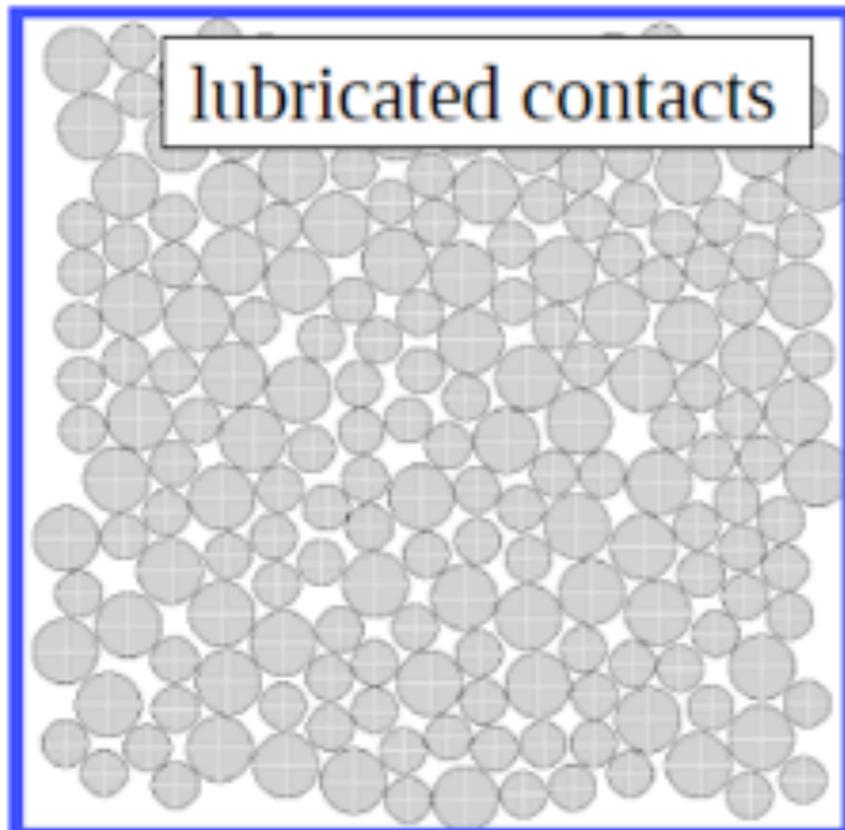
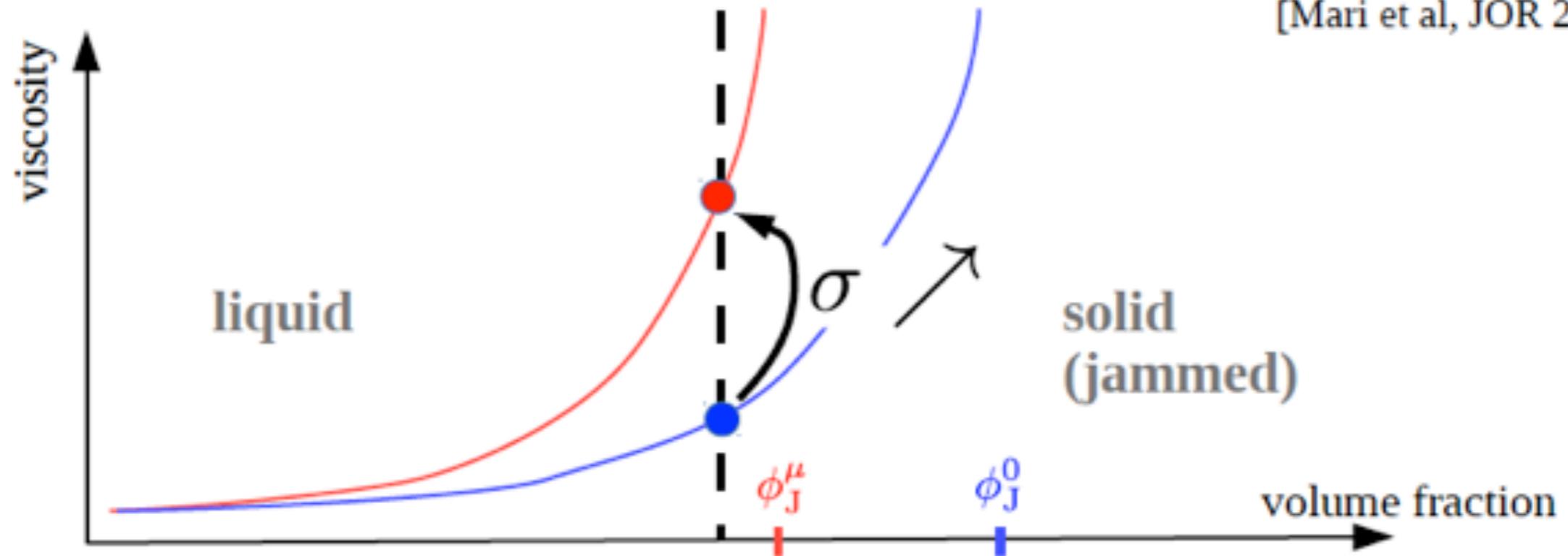
# Discontinuous Shear Thickening



Shear thickening as a (out-of-equilibrium) phase transition?

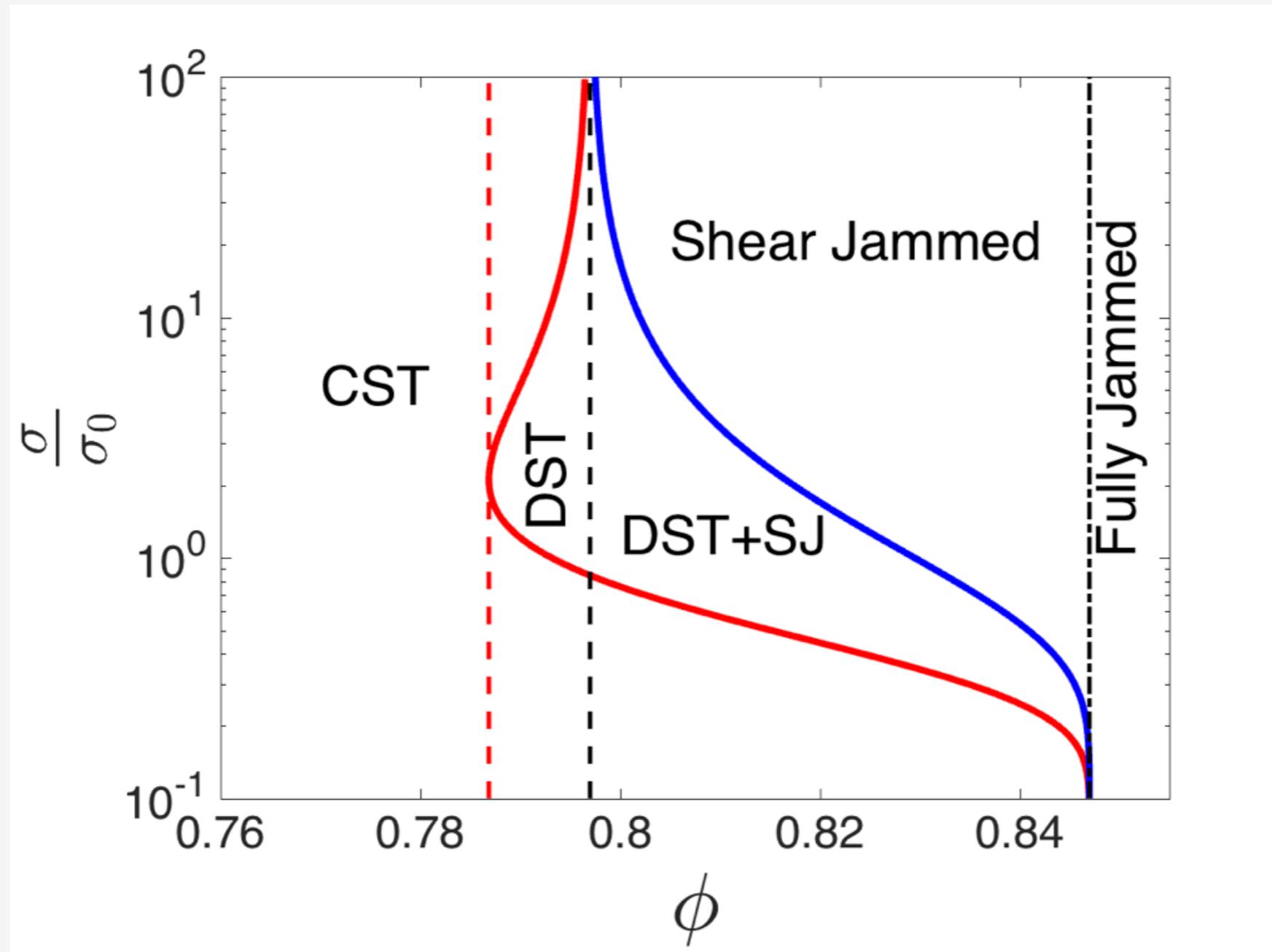
# A Thickening Scenario

[Fernandez et al, PRL 2013]  
[Seto et al, PRL 2013]  
[Heussinger, PRE 2013]  
[Wyart and Cates PRL 2013]  
[Mari et al, JOR 2014]

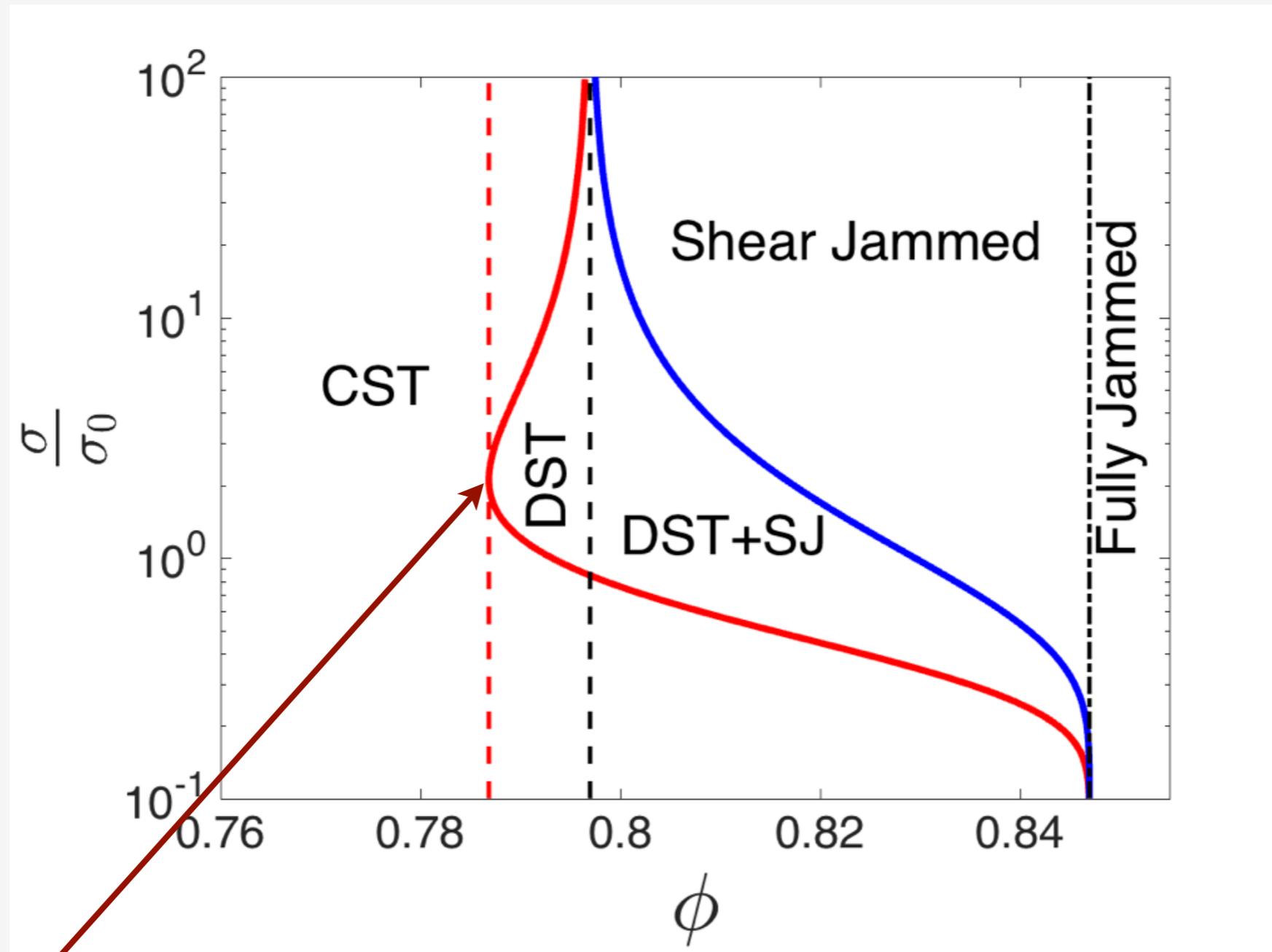


# Phase Diagram from Rheology: Abhi Singh & Jeff Morris

## Phase Diagram from Rheology: Abhi Singh & Jeff Morris



## Phase Diagram from Rheology: Abhi Singh & Jeff Morris



*Is this a critical point ?*

# Clustering of points

Stress = 0.1

Stress = 1

Stress = 100

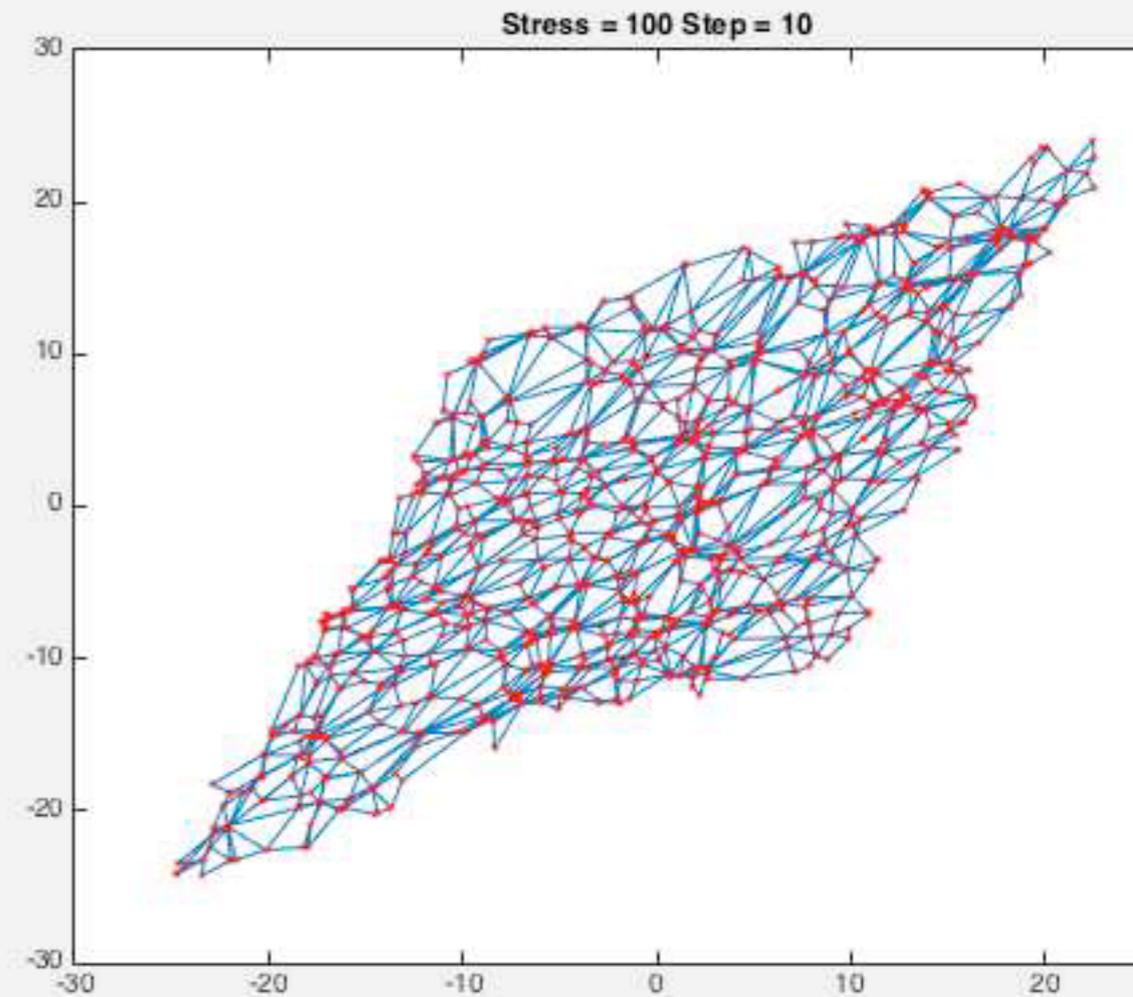
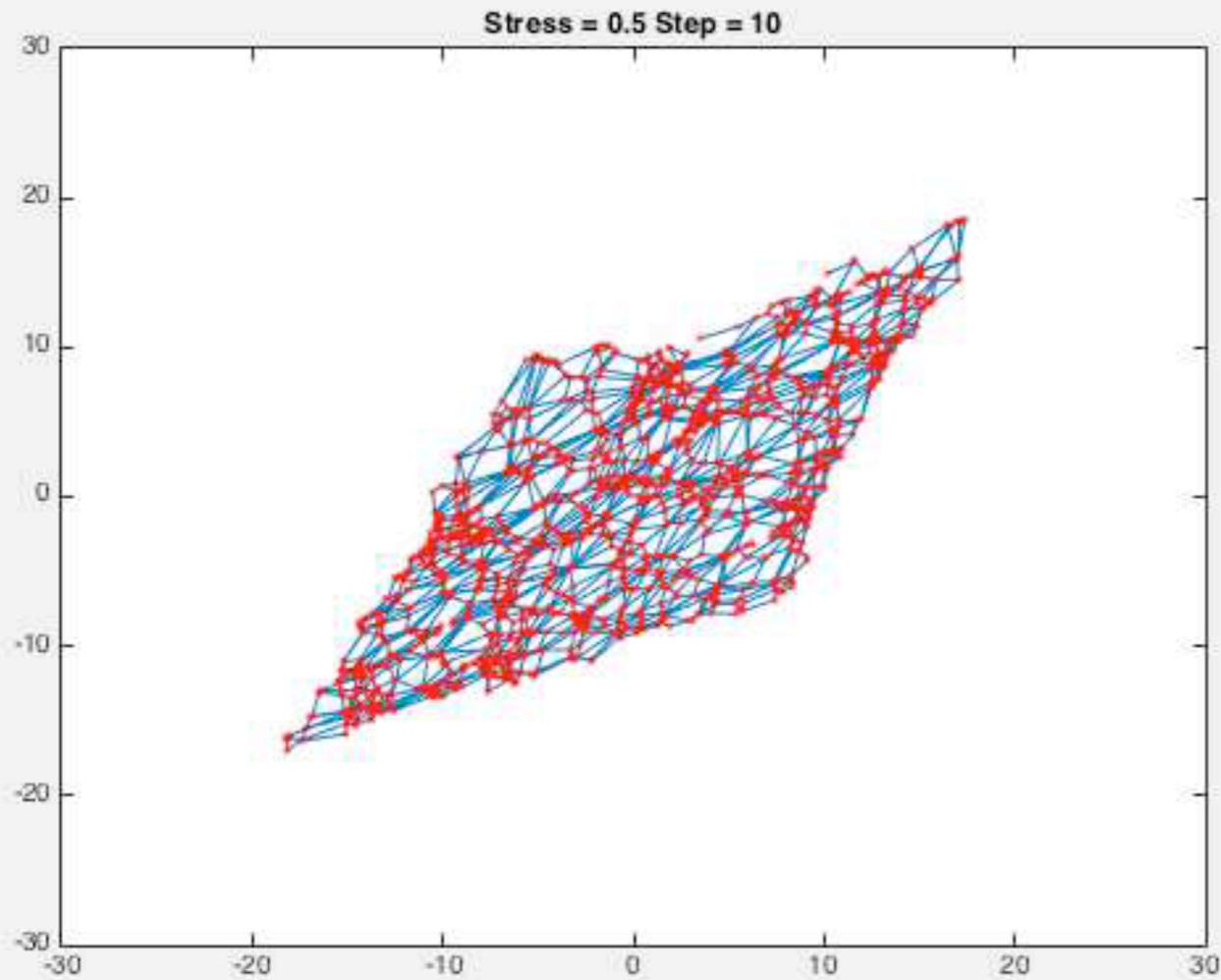


Clustering/Clumping of points

# Height map: constructed from simulations

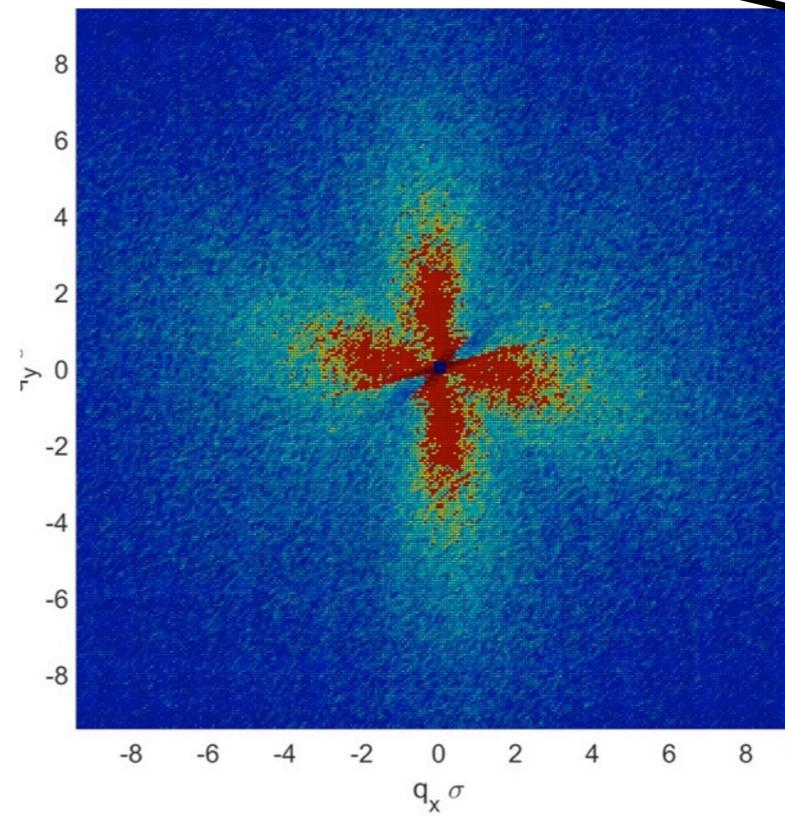
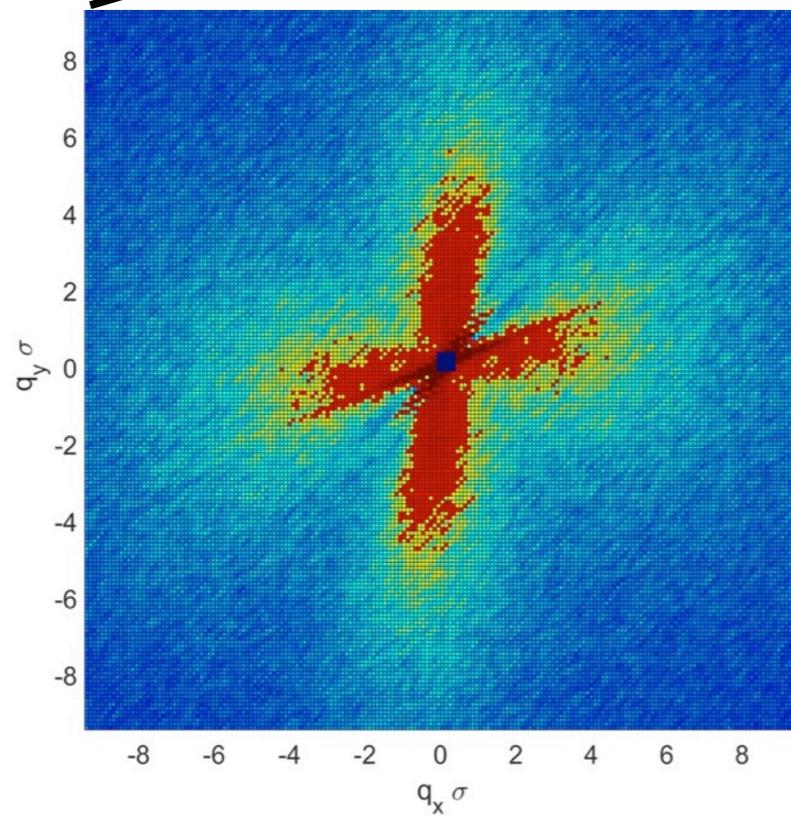
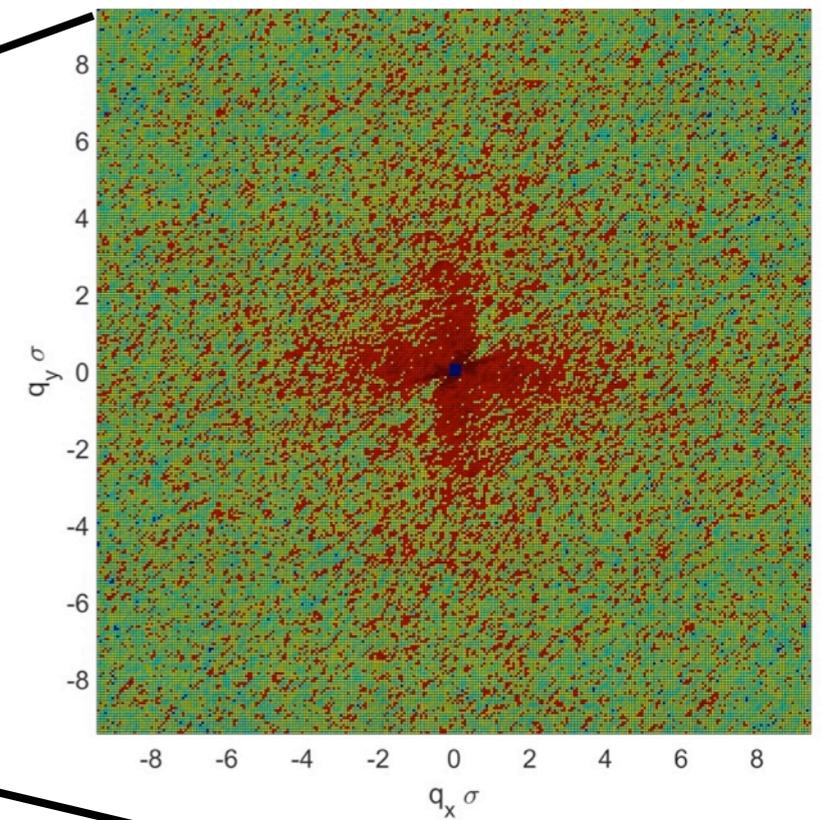
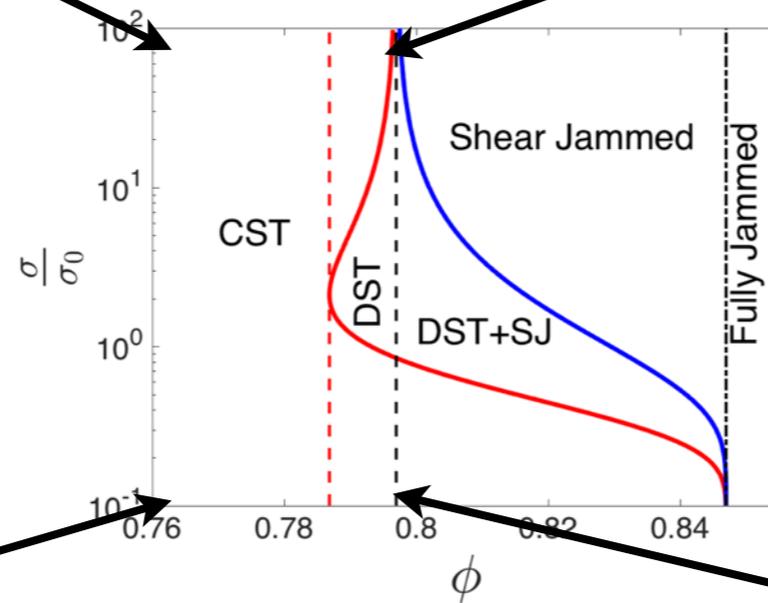
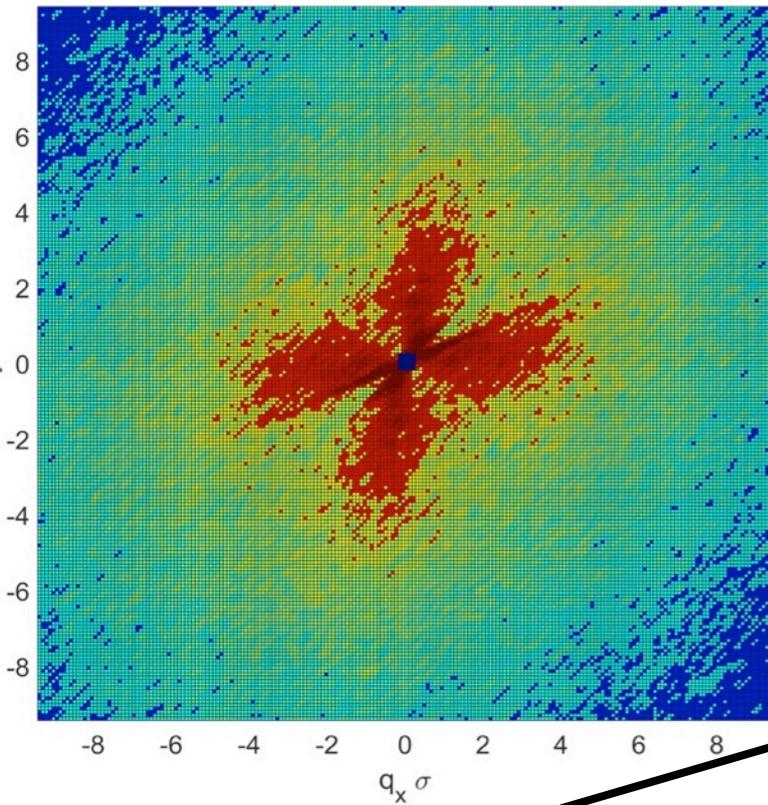
## Point Patterns: Vertices of Force tilings

0.76



# Point Patterns: Vertices of Force tilings

## Structure Factor



# Statistical Mechanics of Granular Media

- Dual Networks: Contacts and Force Tilings

- History Dependence:

Including forces in defining microstates takes away that indeterminacy

- Contact Networks are random but can characterize ensembles relevant for stress transmission

- Pattern formation in height fields: Distinguishes phases