

Interactions III: Vertex models

Note: I am skipping some other really nice models for tissues, including subcellular element models, cellular potts models, finite element models...

1. Zero-motility limit (no activity)

a. $E_{\text{cell}} = \frac{\bar{K}_A}{2} (A - A_0)^2 + \sum_{\text{edges}} \frac{\Lambda}{2} l_{\text{edge}} + \frac{\Gamma}{2} P^2$

$P \equiv \sum_{\text{edges}} l_{\text{edge}}$

3D incompressibility + height fluctuations

interfacial tension

edge

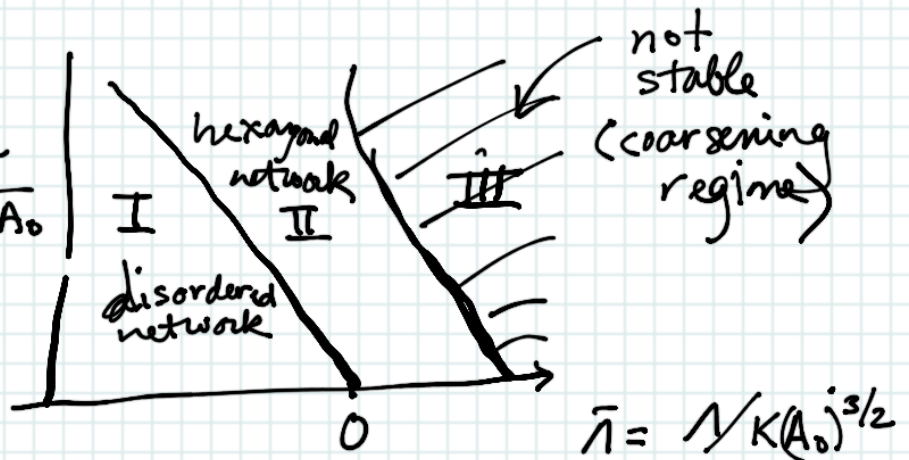
"contractility" P or "limited adhesion molecules"

Farhadifar et al Current Biology 17 2007

Note: lots of others before this. Honda, Hufnagel

b. Ground states:

$$\bar{\Gamma} = \frac{\Gamma}{KA_0}$$



c. For physicists, it is much easier in case where all Λ_i 's are the same and so we can rewrite this as

$$E_{\text{cell}} = K_A (A - A_0)^2 + K_P (P - P_0)^2$$

$$\text{where } P_0 = -\frac{\Lambda}{2\Gamma} \text{ and } K_A = \frac{K_A}{2}$$

$$K_P = \frac{\Gamma}{2}$$

$$E_{\text{tot}} = \frac{1}{K_A A_0^2} \sum_i^N E_i = \sum_i^N \left[(a_i - 1)^2 + \frac{1}{r} (p_i - P_0)^2 \right]$$

$$\text{with } r = \frac{K_A A_0}{K_P} \text{ and } P_0 = \frac{P_0}{\sqrt{A_0}}$$

\sum_i
stiffness
ratio

\uparrow shape index

Homework Exercise:

Calculate the algebraic expressions for the lines shown in the phase diagram for the ground states.

Hint: In phase I $p_i = p_0, a_i = 1 \forall i$

In phase II p_i can be related to $a_i \forall i$

In phase III $p_i = 0, a_i = 0$

d. This is a good model for confluent tissues.

also really fun system for exploring disordered solidification in a system that is very different from sphere packings

e. Beyond ground states

→ biological tissues very rarely look ordered.

→ need to generate an ensemble of higher energy states

skip → numerically, can do an "infinite temperature quench", take a voronoi tessellation of uniformly distributed points, and find nearest minimum using gradient or conjugate gradient descent

$$\mu \vec{r}_i = -\nabla_i \epsilon$$

↕
vertex position i

→ Program ~~is~~ "Surface Evolver" has built in functions to do this, or you can write your own

f. Linear Response: system becomes rigid when shear modulus $g > 0$

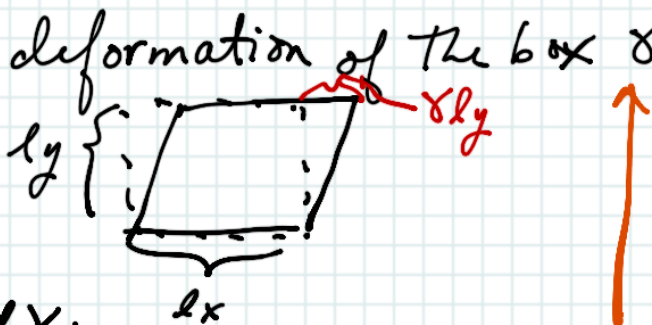
• Calculate the shear modulus around a minimum energy state

• For simple shear, describe deformation of the box γ

$$\epsilon = \mathcal{E}(\{\vec{r}_i\}, \gamma)$$

mechanically stable state at a fixed γ :

$$\epsilon_{\min}(\gamma) = \min_{\{\vec{r}_i\}} \mathcal{E}(\{\vec{r}_i\}, \gamma)$$



extra degree of freedom:
($Nd + 1$) DOF

Tutorial: Calculate shear modulus g

Merkel, Manning NJP 2018
Appendix A7

$$g \equiv \frac{1}{V} \frac{d^2 \varepsilon_{\min}(\gamma)}{d\gamma^2}$$

volume \leftarrow

vertex index (1...N)

$$g = \frac{1}{V} \left(\frac{\partial^2 \varepsilon}{\partial \gamma^2} + \sum_{k, \beta} \frac{\partial^2 \varepsilon}{\partial r_k^\beta \partial \gamma} r_k^{\min, \beta} \frac{dr_k^{\min, \beta}}{d\gamma} \right) \quad (\star)$$

dimension index (x, y)

\rightarrow Want to re-write (this) in terms of the dynamical matrix

$$D_{j\alpha, k\beta} \equiv \frac{\partial^2 \varepsilon}{\partial r_j^\alpha \partial r_k^\beta}$$

labels dimensions
labels vertices

$$= \sum_m \omega_m^2 u_{j\alpha}^m u_{k\beta}^m$$

eigenvalues ≥ 0
eigenvectors
 $m = (1 \dots Nd)$

but force balance means

$$0 = \frac{\partial \varepsilon(r^{\min}(\gamma), \gamma)}{\partial r_j^\alpha}$$

taking total derivative of this equation with respect to γ :

$$0 = \sum_{k, \beta} D_{j\alpha, k\beta} r_k^{\min, \beta} + \frac{\partial^2 \varepsilon}{\partial r_j^\alpha \partial \gamma} \quad (\star\star)$$

Let $\bar{D}_{pq} = \frac{\partial^2 z}{\partial z_p \partial z_q}$ where $z_p = \underbrace{(\vec{r}_1 \dots \vec{r}_N, \delta)}_{3N+1 \text{ - dimensional}}$

$$\bar{D}_{pq} = \sum_m \bar{\omega}_m^2 \bar{u}_p^m \bar{u}_q^m$$

And $\vec{z}^{\min} = (r_1^{\min} \dots r_{Nd}^{\min}, 1)$.

Note that using ~~AA~~, we can re-write ~~A~~ as:

$$Vg \begin{bmatrix} 0 \\ 0 \\ 0 \\ \vdots \\ 1 \end{bmatrix} = \begin{bmatrix} & & \frac{\partial^2 z}{\partial \delta \partial r_1} \\ & & \vdots \\ & & \vdots \\ & & \vdots \\ \frac{\partial^2 z}{\partial r_1 \partial r_1} & \dots & \dots & \frac{\partial^2 z}{\partial \delta^2} \end{bmatrix} \begin{bmatrix} r_1^{\min} \\ \vdots \\ \vdots \\ r_{Nd}^{\min} \\ 1 \end{bmatrix}$$

OR

$$Vg \delta_{pq} = \bar{D}_{pq} z_q^{\min}$$

Take scalar product with \bar{u}_p^m :

$$Vg \bar{u}_p^m = \bar{\omega}_m^2 \sum_q \bar{u}_q^m z_q^{\min} \quad \forall m \quad \text{~~AAA~~}$$

Comment 1: if \exists a zero mode \tilde{m} with $\bar{u}_y^{\tilde{m}} \neq 0$
 (e.g. non-zero overlap with shear DOF)
 then $g = 0$.

entry in the δ^{th} row of mode \tilde{m}

Comment 2: otherwise, all zero modes have vanishing overlap with the shear degree of freedom so the shear must be the sum over remaining e-vectors:

$$\delta x q = \sum_{\substack{m \text{ with} \\ \text{nonzero } \omega_m}} \bar{u}_x^m \bar{u}_q^m \Rightarrow 1 = \sum_{\substack{m \text{ non-zero} \\ m, q}} \bar{u}_x^m \bar{u}_q^m \bar{z}_q^{\min} \\ (\text{because } \bar{z}_x^{\min} = 1)$$

Define $\{\tilde{m}\}$ as m s.t. $\omega_m \neq 0$.

Inserting $\delta x q$ ~~we find~~ we find

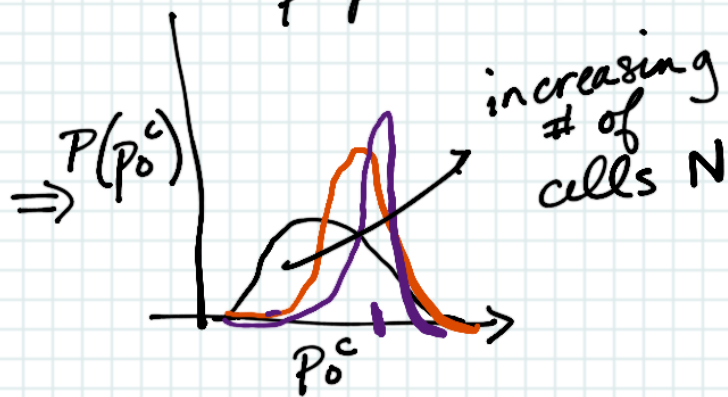
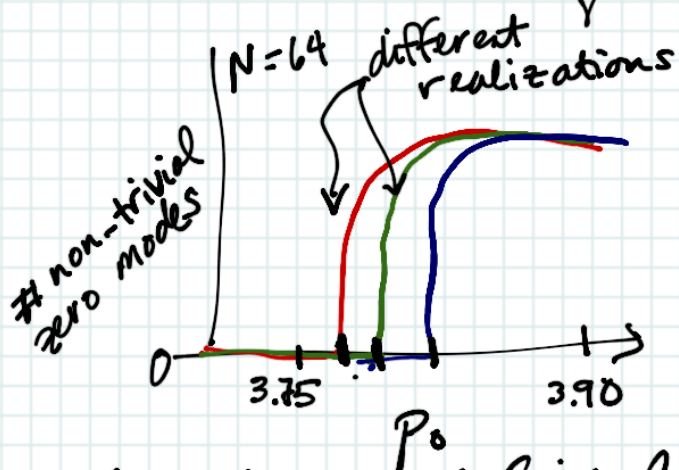
$$1 = \sum_{\tilde{m}} \bar{u}_x^{\tilde{m}} \underbrace{\sum_q \bar{u}_q^{\tilde{m}} \bar{z}_q^{\min}}_{\frac{V q \bar{u}_x^{\tilde{m}}}{\bar{\omega}_m^2}} \Rightarrow 1 = V q \sum_{\tilde{m}} \frac{\bar{u}_x^{\tilde{m}}}{\bar{\omega}_m^2}$$

$$\Rightarrow \boxed{g = \frac{1}{V} \left[\sum_{\tilde{m}} \frac{(\bar{u}_x^{\tilde{m}})^2}{\bar{\omega}_m^2} \right]^{-1}} \quad \text{if no non-trivial zero modes.}$$

Result $g = \begin{cases} 0 & \text{if } \exists \text{ a nontrivial zero mode} \\ \text{otherwise, it's a weighted sum of overlaps of eigenvectors with shear D.O.F} \end{cases}$

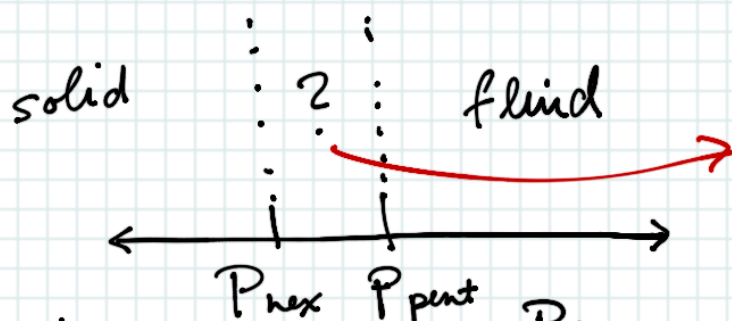
Easiest to quantify the number of non-trivial zero modes: for ordered ground states, Stapleton et al EPJE 2010 demonstrate that the system is linearly stable below $P_0 = P_{\text{th}} \approx 3.72$

For disordered states, we can numerically calculate the number of zero modes as a function of p_0 for different realizations of the disorder with a given preparation protocol



extrapolate and find $\lim_{N \rightarrow \infty} \overline{p_0^c} = p_0^* \approx 3.81 \approx p_0^{\text{pent}}$

But, preparation protocol matters!
 ↳ see slide

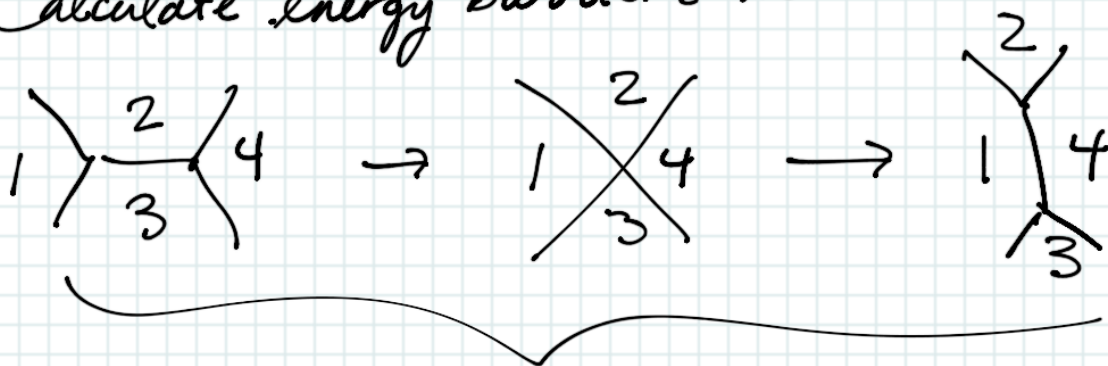


hexagons linearly unstable
 but disordered states linearly stable

Preeti Sahu
 Kang
 at XiV
 2005-12-7-14

g. Nonlinear response: p_0

Calculate energy barriers for localized rearrangements

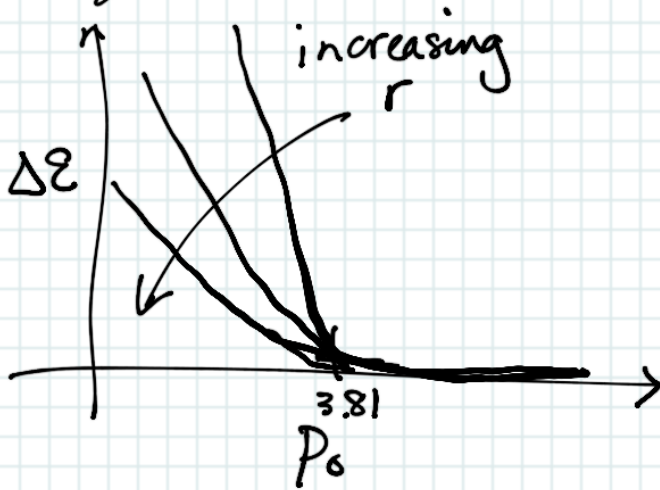


T_1 transition

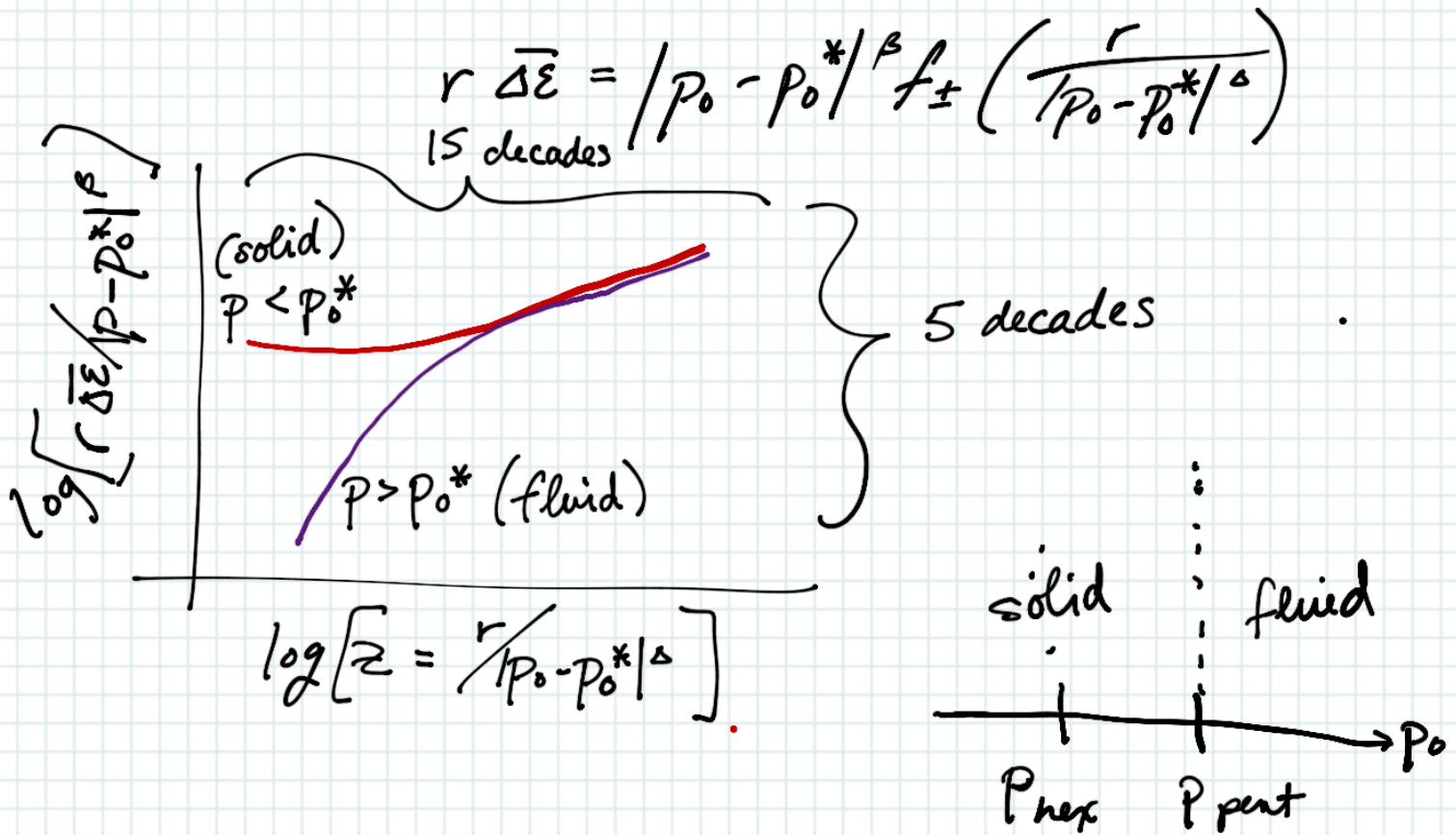
→ execute T_1 transition by shortening 1 edge + extending in other direction (other transition paths possible)

→ minimize global energy (allowing passive T_2 transitions elsewhere)

Result



Scaling ansatz: just like $(m, h, T - T_c)$ in Ising model
 $(r \bar{\Delta E}, r, p_0 - p_0^*)$ here \Rightarrow

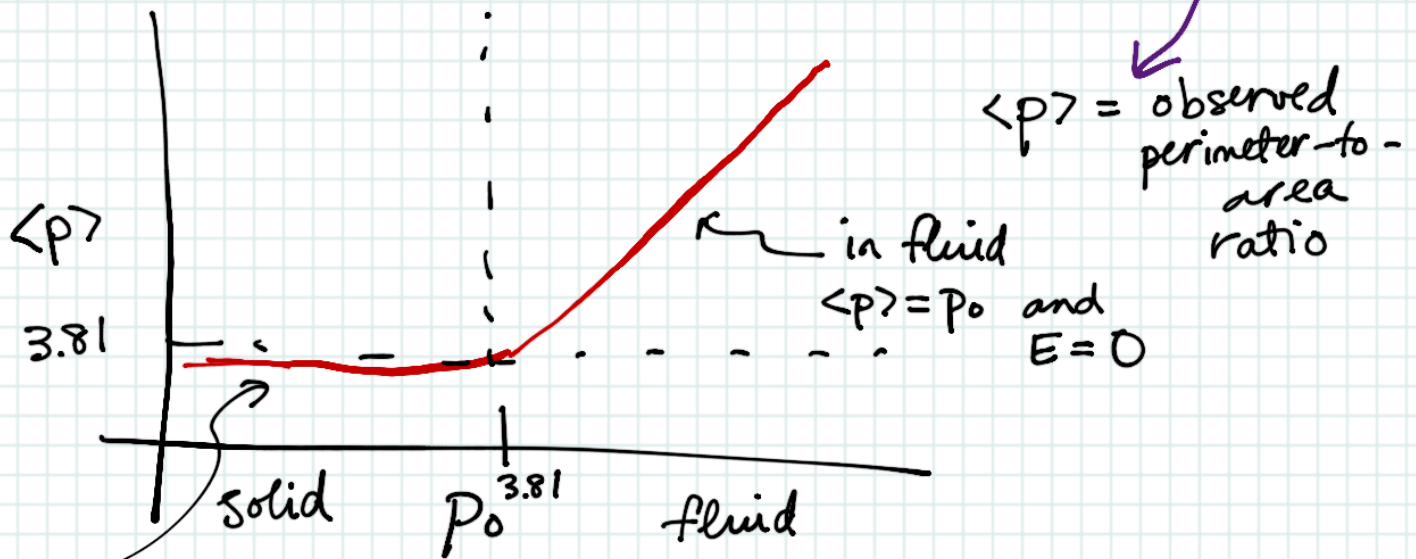


Interesting: energy barriers seem to go to zero

Sahn et al: New result (energy barriers $\rightarrow 0$ at ~ 3.81 for ordered solids)
at same location as shear modulus goes to zero.

h. Structural Order parameter:

Unlike particulate matter, vertex models have a structural order parameter for the transition:



In solid
 $p \neq p_0$
 $E > 0$

Idea: perhaps rigidity occurs because system cannot minimize its perimeter below some value (e.g. a minimal surface)

2. Adding activity

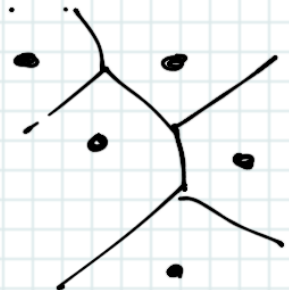
Czajkowski

- Self-propelled Vertex: arxiv 1905.01603
- developed voronoi models to simplify activity

E. Voronoi models:

1. Model description.

DOF are cell centers: \vec{r}_i
cell shapes are given by
a voronoi tessellation (Wigner-Seitz
cell)



- interactions are driven by cell shapes according to usual energy functional:

$$E = \sum_i^N [K_A (A - A_0)^2 + K_P (P - P_0)^2]$$

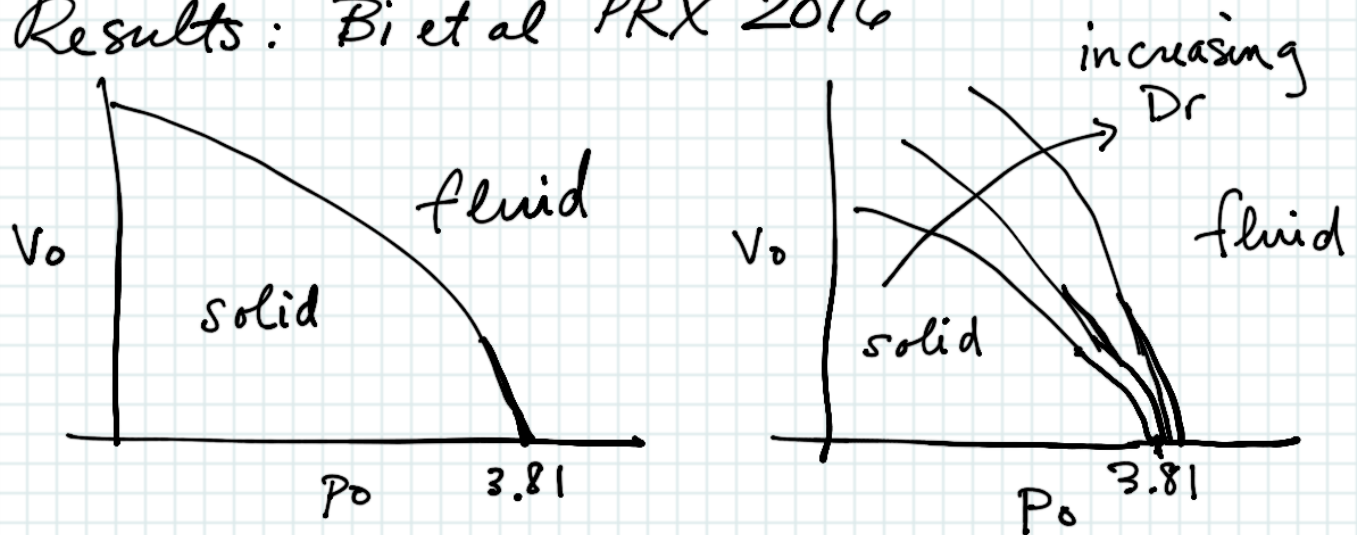
- cells move according to overdamped dynamics + self-propelled part:

$$\frac{d\vec{r}_i}{dt} = \mu \vec{F}_i + v_0 \hat{n}_i$$

$$\vec{F}_i = -\vec{\nabla}_i E$$

$$\partial_t \Theta_i = \text{white noise with strength } D_r.$$

2. 2D Results: Bi et al PRX 2016



Comment 1: similar to SPP models

- increasing Dr enhances fluidization
- can apply same argument as in Lecture 3 to show displacements are highly weighted by low frequency normal modes.

Comment 2: Structural order parameter still works.

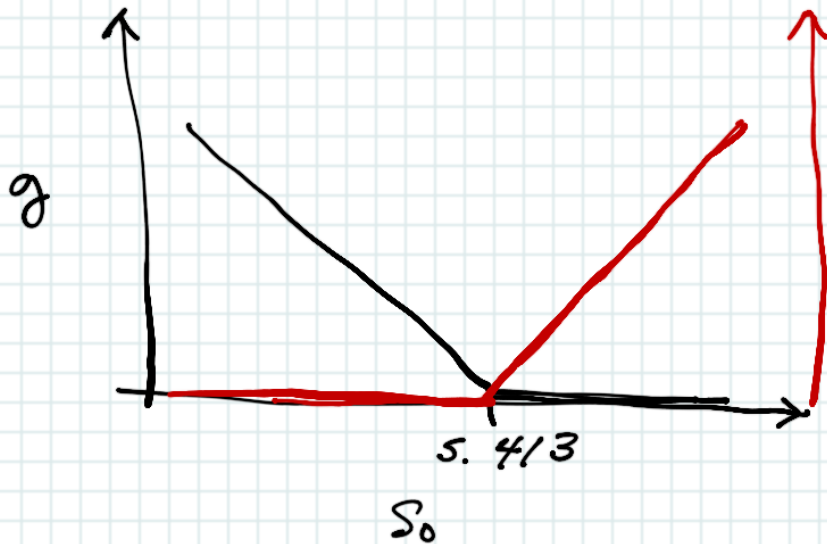
MSD (dynamical data)
matches
shape index $\langle p \rangle$

Slide: phase diagram

3. 3D Results : Merkel + Manning, ArXiv 2017
 'zero temperature' $\rightarrow v_0 = 0$

$$E = \sum_i \left[K_v (v_i - v_0)^2 + K_s (s_i - s_0)^2 \right]$$

$$s_0 = \frac{S_0}{\langle V \rangle^{2/3}} = \text{3D shape index} \quad \left| \quad \langle S \rangle = \frac{\langle s_i \rangle}{\langle V \rangle^{2/3}}$$



Same as in 2D \Rightarrow

$\langle S \rangle$ structural order parameter.
 = average observed shape index

4. Rigidity in these systems different from jamming.

When do the number of constraints = number DOF?

$$2N \left(\begin{array}{l} 1 \text{ Volume constraint} \\ 1 \text{ Surface constraint} \end{array} \right) \text{ per cell} = \underbrace{3N}_{\text{SPV in 3D}}$$

underconstrained?

Better:

$$\bar{D}_{pq} = 2 \sum_i \left[\underbrace{\frac{\partial s_i}{\partial z_p} \frac{\partial s_i}{\partial z_q}}_{\text{spring terms}} + \underbrace{K_v \frac{\partial v_i}{\partial z_p} \frac{\partial v_i}{\partial z_q}}_{\text{residual stresses}} + \underbrace{\left(s_i - s_0 \right) \frac{\partial^2 s_i}{\partial z_p \partial z_q} + K_v (v_i - 1) \frac{\partial^2 v_i}{\partial z_p \partial z_q}}_{\substack{\text{surface tension} \\ \text{pressure}}} \right]$$

Merkel et al PNAS 2019

Large class of models are all very similar:

→ vertex, voronoi models for cells in 2D*, 3D

→ spring + fiber network models

Observation

SPV in 3D : $3N$ DOF

vertex model in 2D: $4N$ DOF (for 3-fold coord network)

cellular potts models: arbitrary DOF

all seem to exhibit same rigidity transition

Another important contribution to rigidity: states of self stress



vs.

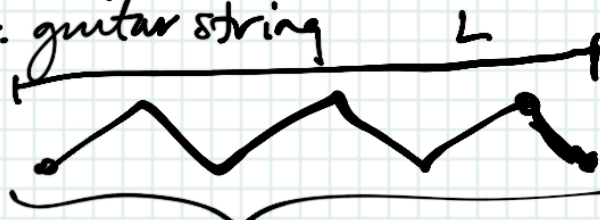


↑ state of self stress
(stresses that do not result in node displacement)

A self-stress can be created by **geometric incompatibility**:

example: guitar string

fix L
vary $l_0 \Rightarrow$
critical point
 $l_0^* = \frac{L}{n}$



n segments, rest length l_0

$n l_0 > L$

compatible
no self stress



$n l_0 < L$
incompatible,
self-stress

For spring networks (and vertex models)

energy $E = N ((\bar{l} - l_0)^2 + \sigma_e^2)$

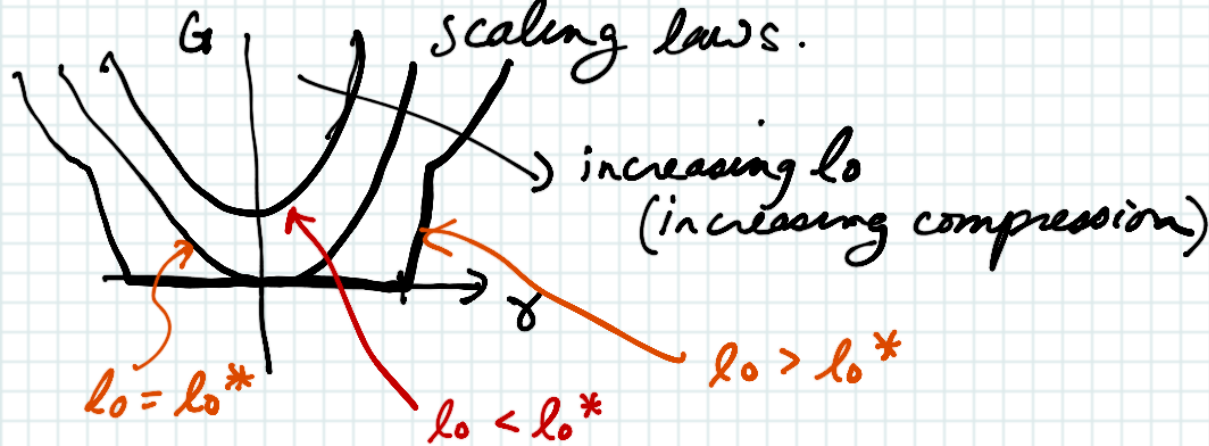
system needs to compromise b/w minimizing $|\bar{l} - l|$ and σ_e . How?

One can show analytically that the geometrically induced self-stress gives

$$\bar{l}_{\min}(\sigma_e) = l_0^* - \underbrace{a_e \sigma_e}_{\text{constants}} + \underbrace{b_e \sigma_e^2}_{\text{strain}}$$

then E can be written as a function of l_0^* , l_0 , & only!

and we can take derivatives and compute scaling laws.



Different path to rigidity than jamming
(where $\# \text{DOF} = \# \text{constraints at rigidity}$)