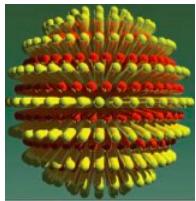


Lecture 2 – Collective effects in dense active systems: phase separation, jamming & glassy states

M. Cristina Marchetti

Physics, Department, Syracuse University



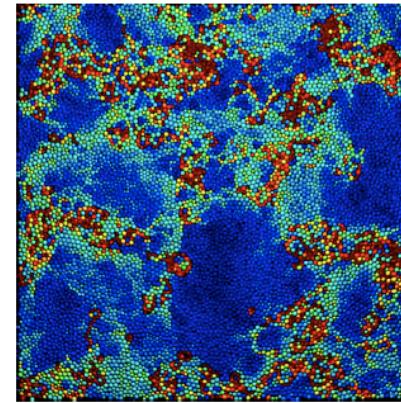
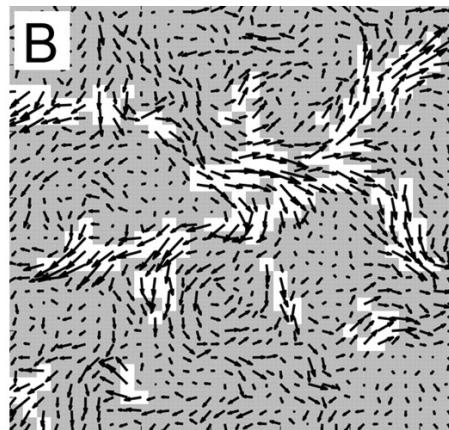
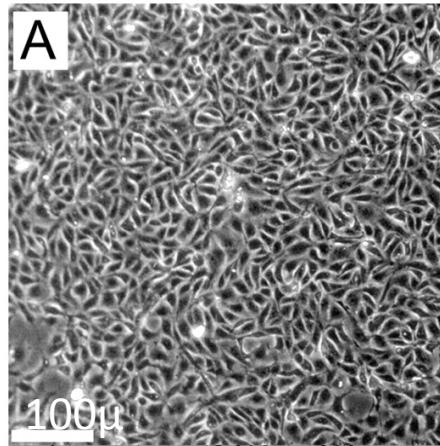
Soft Matter
Program @SU



SYRACUSE
BIOMATERIALS
INSTITUTE

GIST, Korea, July 2014

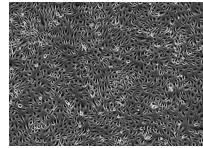
Glass-like dynamics of collective cell migration



Hedges, 2009
supercooled fluid mixture

Angelini *et al.* 2011: MDCK epithelial cells, v_{avg} 35 $\mu\text{m}/\text{h}$

Szabó *et al.*, 2010
BAEC endothelial cells →

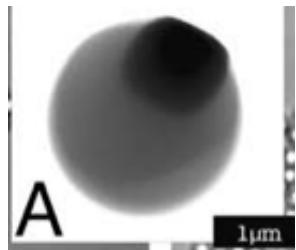


- ❑ Suppression of diffusive motion with increasing cell density
- ❑ Dynamics controlled by dynamical heterogeneities

Role of crowding and steric effects vs activity

Active Colloids

Palacci et al, Science2013



2D

$L = 600\text{nm}$

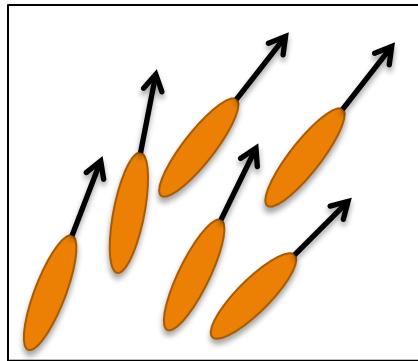
$v_0 = 15\mu\text{m} / \text{s}$



Active Particles & Types of Order



Polar (head \neq tail):
bacteria, birds, fish, ...

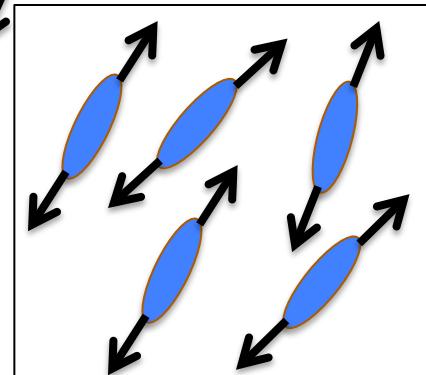


“Ferromagnetic” order: a
moving state or flock

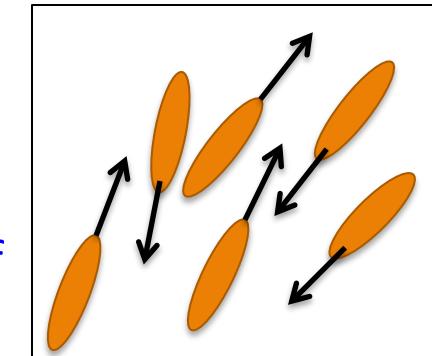
Nematic order of
polar particles



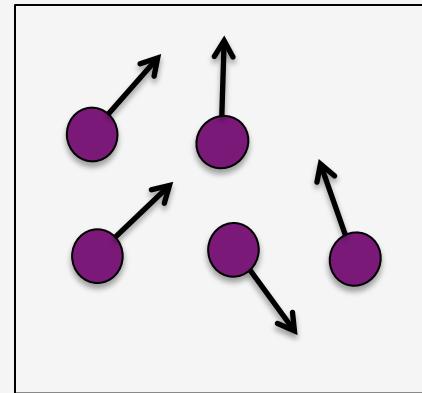
Apolar: melanocytes,
vibrated grains, ...



Nematic order: no
mean motion



Spherical:
colloids



No orientational
order (unless
imposed by aligning
rules), but surprising
collective behavior

Self-propelled repulsive soft colloids:
a simple model to explore the interplay of self-propulsion
and crowding in active systems. Possible relevance to
collective cell migration, wound healing and cell sorting.

❖ Self-propelled disks with **no alignment** →**active colloids**

❖ SP disks with alignment as a model for active glassy cell layers



Silke Henkes
Aberdeen, UK



Yaouen Fily,
Brudeis



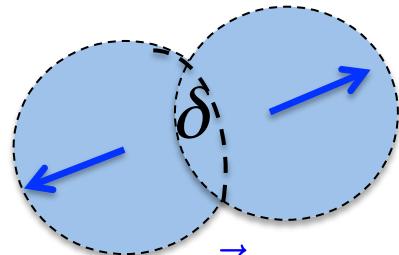
Xingbo Yang,
Syracuse

Self-Propelled particles + repulsive interactions

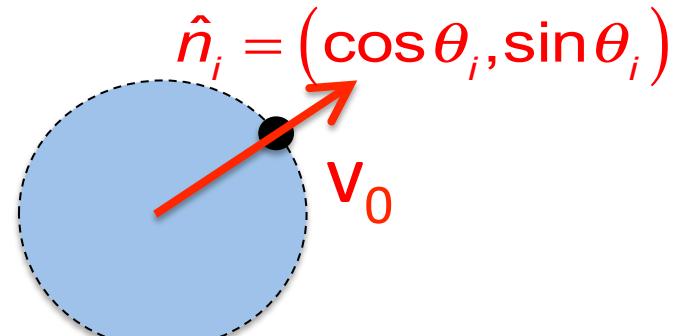
- Repulsive disks of radius a
- SP speed v_0 along axis \hat{n}_i
- Orientational noise D_r

Fily & MCM PRL 108, 235702 (2012)
Fily, Henkes & MCM, Soft Matter 10, 2132 (2014)

$$\vec{v}_i = v_0 \hat{n}_i + \mu \sum_{j \neq i} \vec{f}_{ij}$$
$$\dot{\theta}_i = \eta_i(t) \quad \langle \eta_i(t) \eta_j(t') \rangle = 2D_R \delta_{ij} \delta(t - t')$$



$\vec{f}_{ij} \sim k\delta$: spring-like pair repulsive forces \propto overlap δ



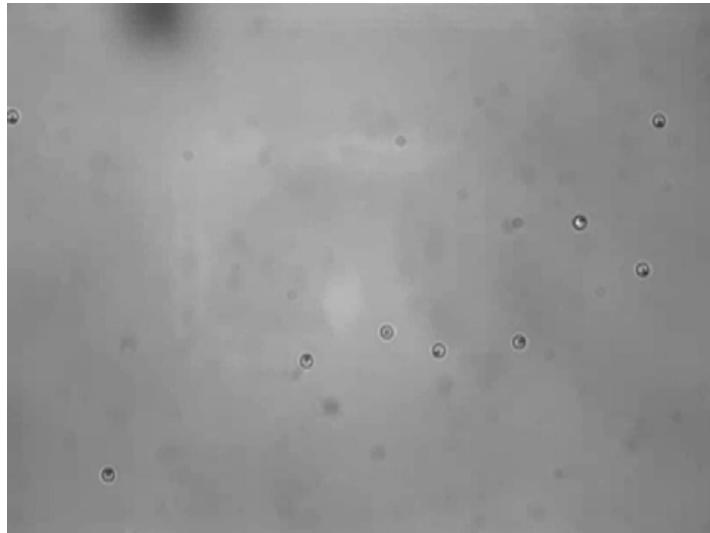
$$\phi = \frac{N\pi a^2}{L^2} \quad \text{packing fraction}$$

See also:
Redner et al PRL 110, 055701 (2013);
Cates & Tailleur EPL 101 20010 (2013);
Buttinoni et al PRL 110, 238301 (2013)

Single Active Particle

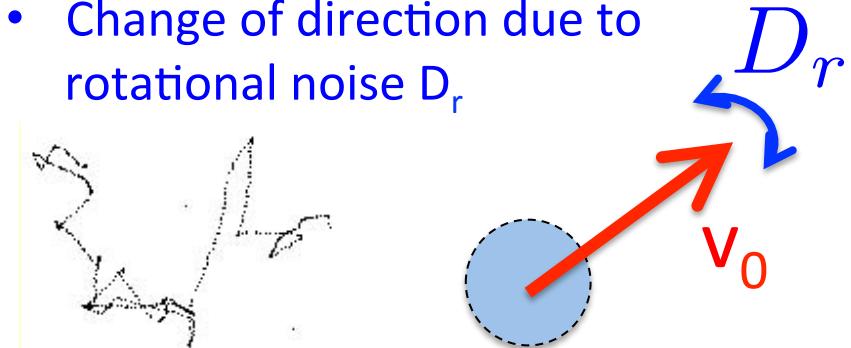
Brownian particle:
random walk (RW)

$$\langle [\mathbf{r}(t) - \mathbf{r}(0)]^2 \rangle = 2Dt$$
$$D = \frac{k_B T}{\zeta}$$



Active particle: persistent RW

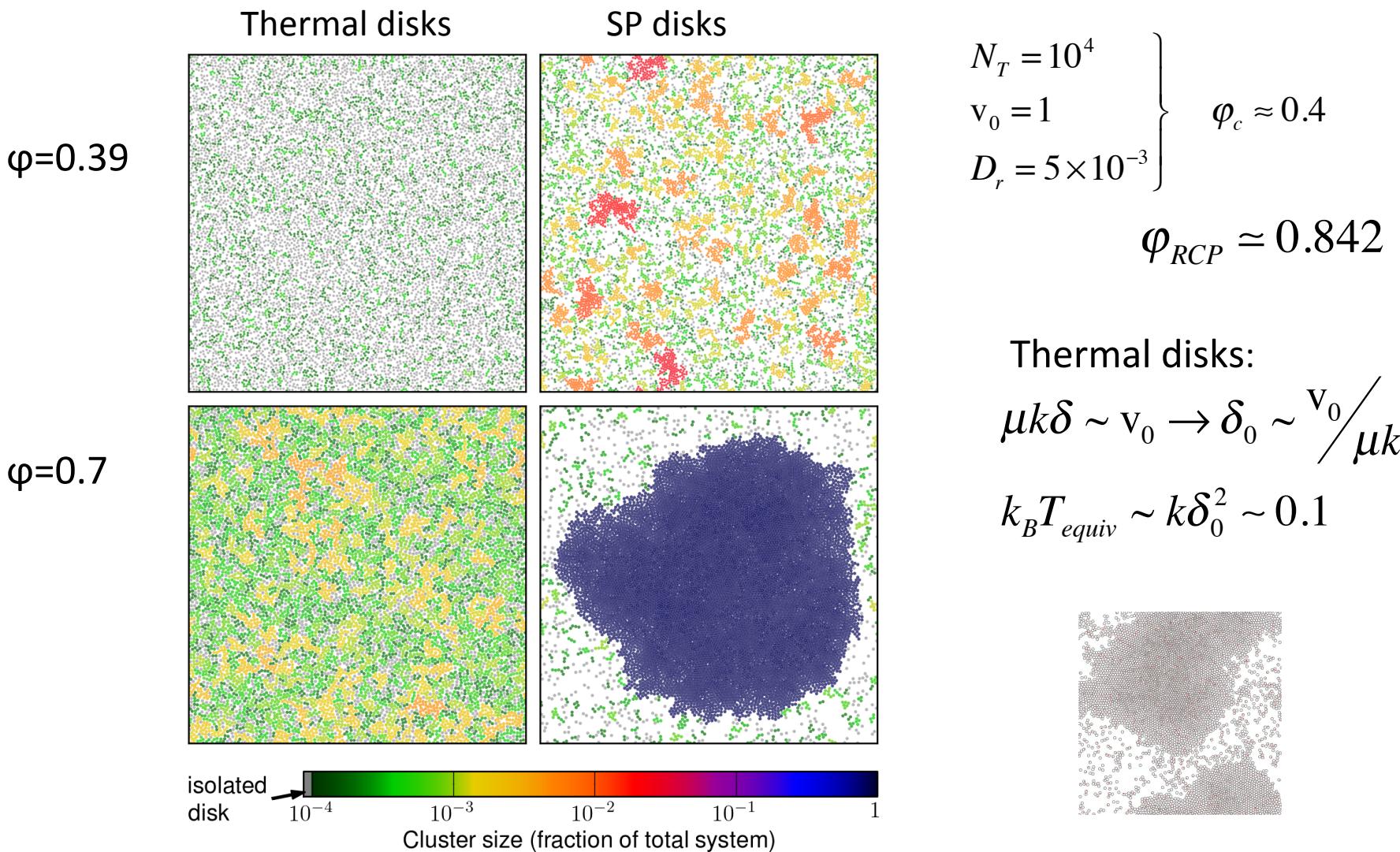
- Ballistic ‘runs’ at speed v_0
- Change of direction due to rotational noise D_r



$$D_{eff} = \frac{v_0^2}{2D_r}$$

Light-activated colloids (cf E. coli)
Palacci et al 2013 $v_0 = 15 \mu m / s$

Athermal Phase Separation with no Attraction



``Self-Trapping''

One particle in one dimension: Schnitzer, PRE 48, 2553 (1993)

If the SP speed is $v(x)$ is position-dependent particles accumulate in region of small $v(x)$

steady state



$$\rho(x) = \rho_0 \frac{v(0)}{v(x)}$$

\neq Brownian diffusion
 $\rho = \text{constant}$

many particles:

$$v(x) \rightarrow v(\rho(x))$$

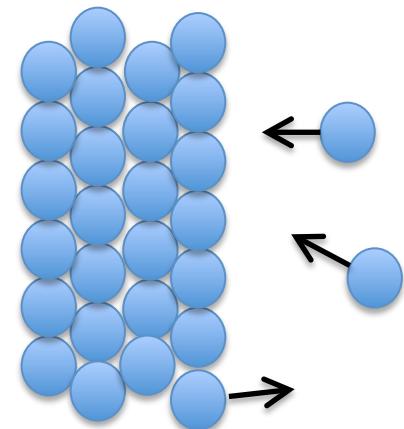
\rightarrow ``self-trapping''

Tailleur & Cates, PRL 2008

Kinetic argument:

small D_r : active pressure
overcomes steric repulsion
Redner et al, 2013

$$p_a \sim v_0^2 \rho_{gas}$$



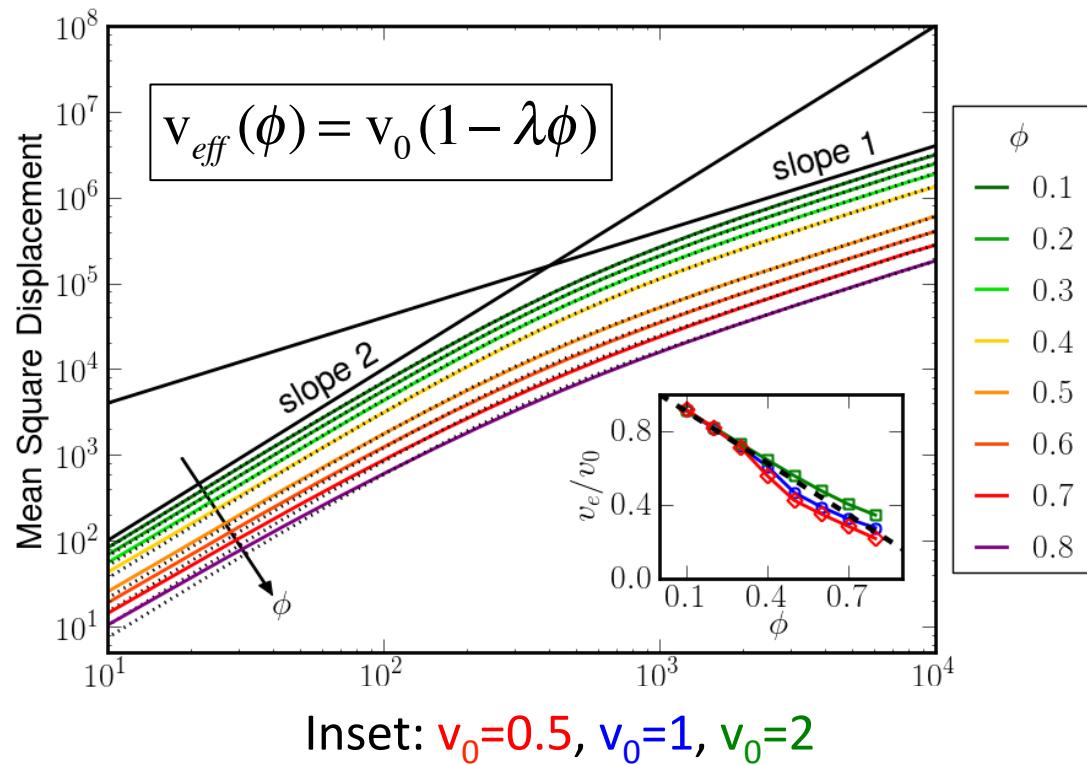
Crowding suppresses motility

Persistent random walk (PRW)
of single SP disk

$$\langle [\Delta \mathbf{r}(t)]^2 \rangle = 4 \frac{v_0^2}{2D_r} \left[t + \frac{1}{D_r} (e^{-D_r t} - 1) \right]$$
$$\sim 4Dt$$
$$D = \frac{v_0^2}{2D_r}$$

Moderately dense suspensions of
SP disks: the MSD can be fitted by
PRW form with

$$v_0 \rightarrow v_{eff}(\phi)$$



Expect effective (mean-field) model to apply if
rotational correlation time $1/D_r >$ mean free time
between collisions.

Effective continuum model

(Fily & MCM, PRL 2012; Farrell, MCM, Marenduzzo & Tailleur PRL 2012)

❖ density ρ

❖ mean orientation (polarization) \mathbf{p}

convection
diffusion
relaxation

$$\begin{aligned}\partial_t \rho &= -\nabla \cdot [v_{eff}(\rho)\mathbf{p}] + D\nabla^2 \rho \\ \partial_t \mathbf{p} &= -D_r \mathbf{p} - \frac{1}{2}\nabla \cdot [v_{eff}(\rho)\rho] + K\nabla^2 \mathbf{p}\end{aligned}$$

For $t \gg 1/D_R$ can be recast as a diffusion equation with effective diffusivity \mathcal{D}_{eff} that changes sign above φ^*

$$\mathcal{D}_{eff} = D + \frac{v_{eff}^2}{2D_R} \left(1 + \frac{d \ln v_{eff}}{d \ln \rho} \right) < 0 \quad \text{for} \quad \varphi \geq \varphi^*(v_0, \lambda, D_r)$$

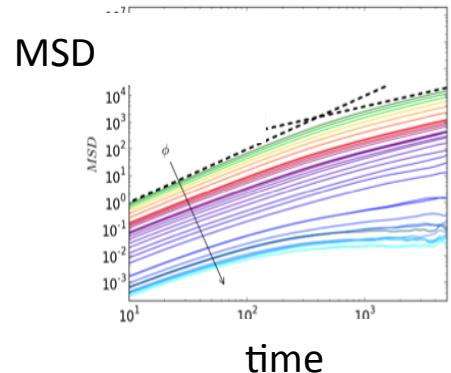
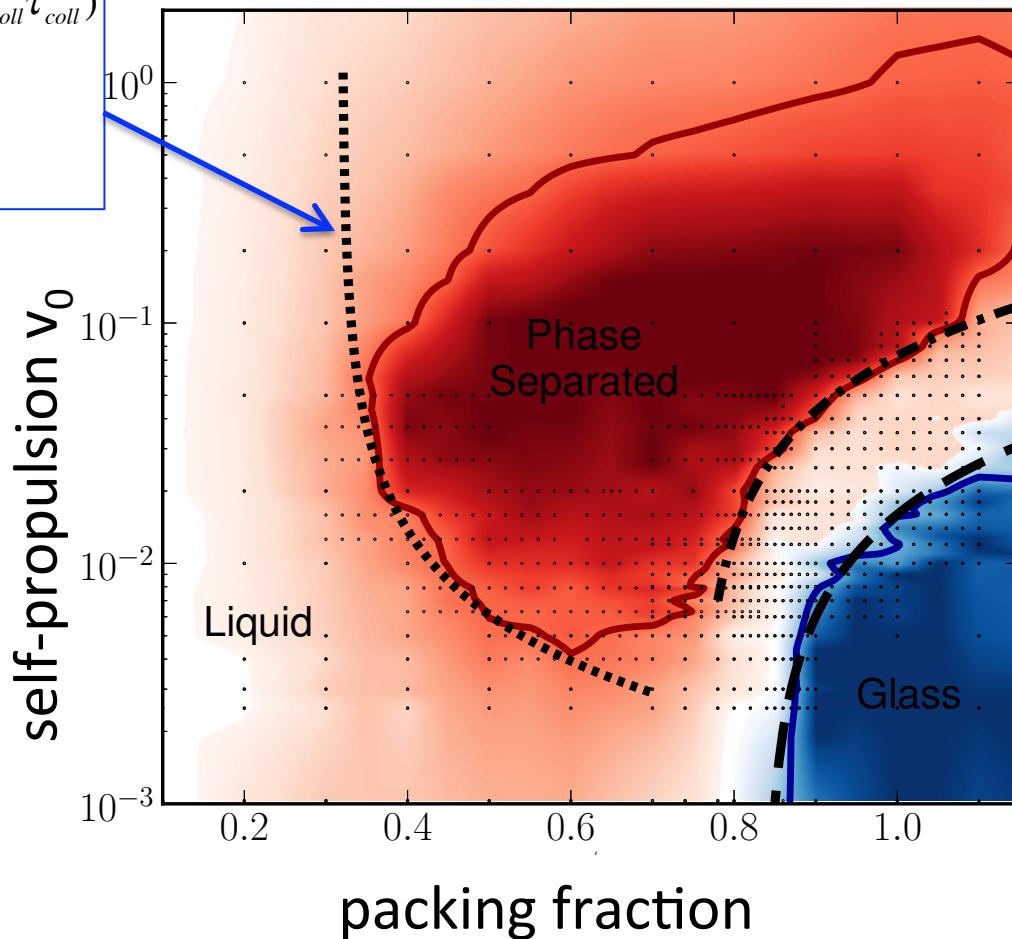
→ spinodal

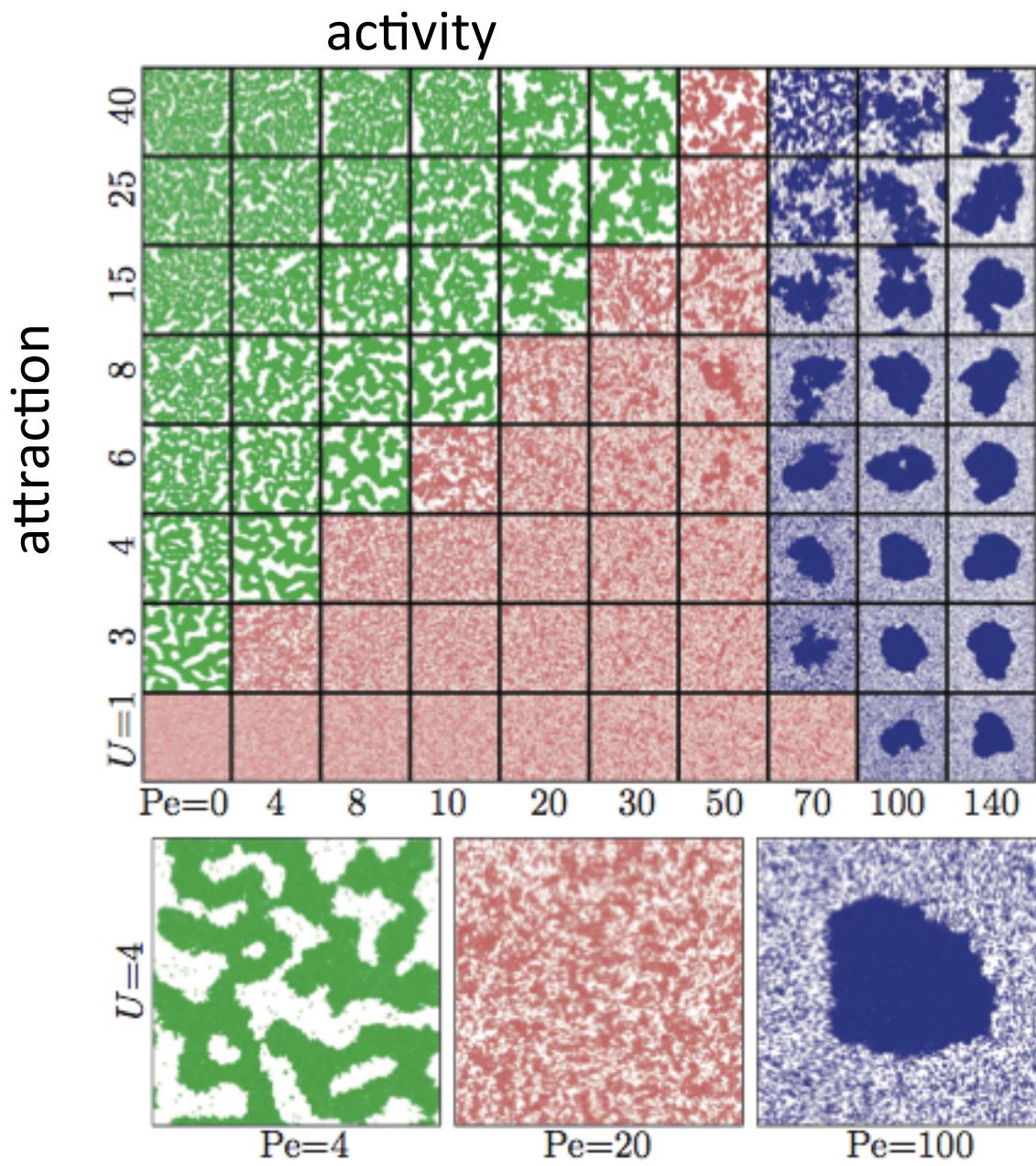
Spinodal line from MFT with

$$v(\rho) = v_0(1 - f_{coll}\tau_{coll})$$

$$f_{coll} = 2a\rho v_0$$

$$\frac{1}{\tau_{coll}} = \frac{v_0}{a} + D_r$$

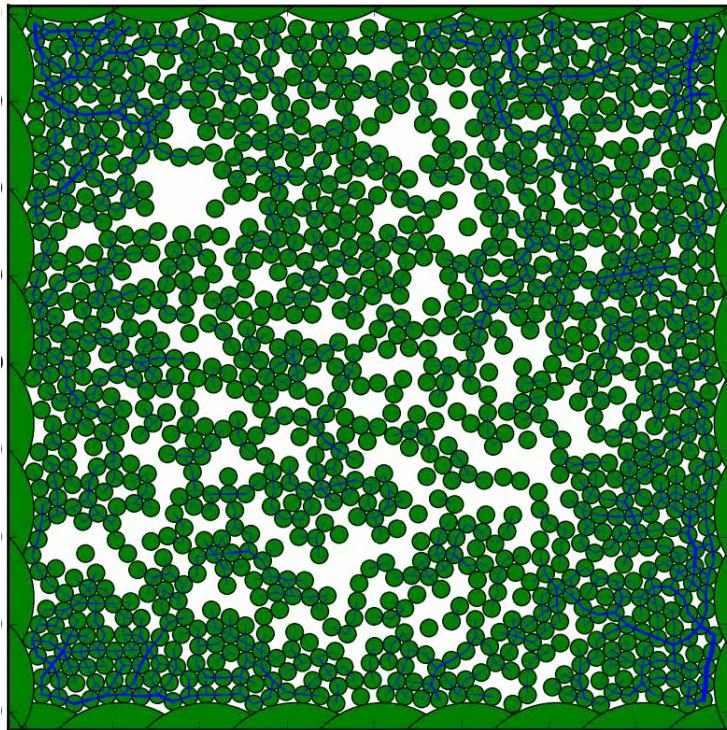




Redner, Baskaran &
Hagan, PRE 3013

Confined Active Colloids

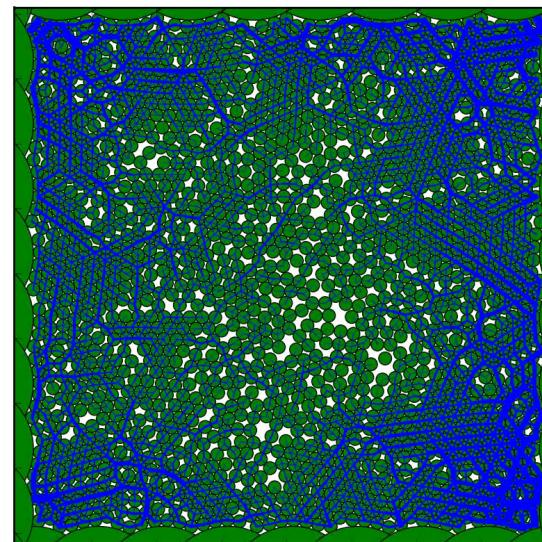
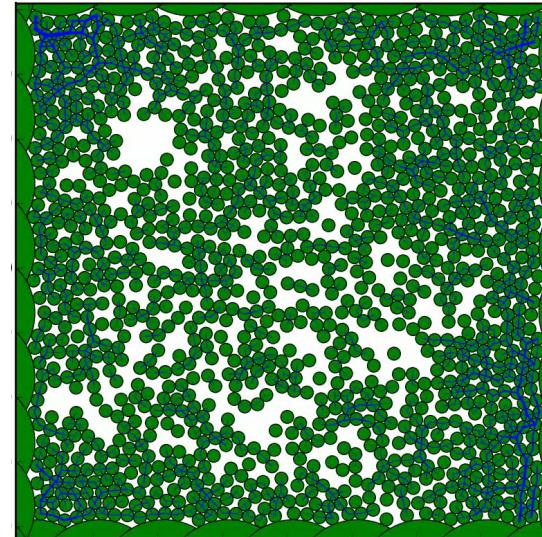
Small rotational diffusion rate



Increase
Rotational
diffusion

Increase
Packing
fraction

1. Wall aggregation
2. Inhomogeneous forces



Two ways to calculate pressure

1. Force per unit length on the wall.

2. Irving-Kirkwood pressure:

$$\sigma_{\alpha\beta}^{IK} = \sigma_{\alpha\beta}^{int} + \sigma_{\alpha\beta}^{act}$$

$$\sigma_{\alpha\beta}^{int} = \frac{1}{L^2} \left\langle \sum_{i \neq j} F_{ij}^\alpha r_{ij}^\beta \right\rangle$$

$$\sigma_{\alpha\beta}^{act} = \frac{1}{L^2} \left\langle \sum_i F_{iact}^\alpha r_i^\beta \right\rangle$$

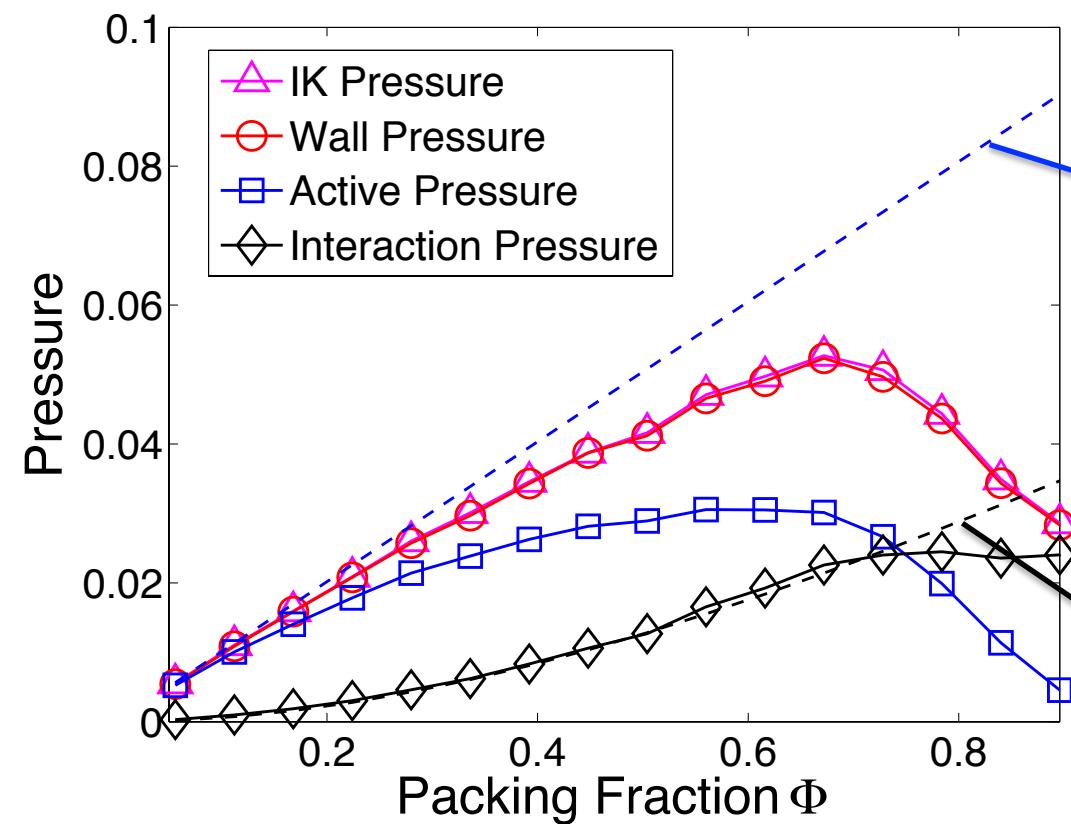


$$P_{act} = \sigma_{\alpha\alpha}^{act} / 2$$

$$P_{int} = \sigma_{\alpha\alpha}^{int} / 2$$

$$P_{IK} = \sigma_{\alpha\alpha}^{IK} / 2$$

Non-monotonic Pressure



Ideal active gas pressure:

$$P_{act} = \frac{\rho v_0^2}{2\mu D_r} \left[1 - \exp\left(-\frac{D_r L}{2v_0}\right) \right]$$

$$D_r^{-1} \gg L / v_0 \quad \longrightarrow \quad P_{act} \sim \rho \frac{v_0 L}{4\mu} \quad *$$

(S. A. Mallory et al. 2013)

* Knudsen gas

Interaction pressure:

$$P_{int} = c \left(\frac{L v_0}{16R} \phi^2 - \frac{L v_0}{48R} \phi^3 \right)$$

c is a fitting parameter
and chosen to be 1.2 here.

$$D_r^{-1} \gg L / v_0$$

Agent-Based Model of Collective Cell Migration

Henkes, Fily & MCM, PRE 2011

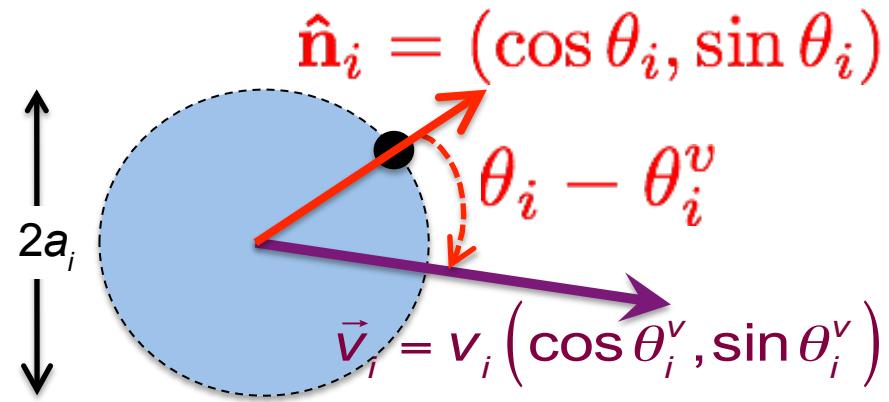
New ingredients:

- Alignment rule*

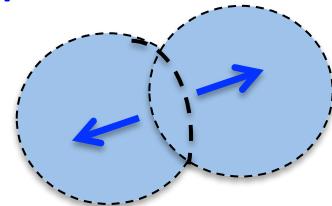
- SP represents cell polarization

$$\mathbf{v}_i = \dot{\mathbf{r}}_i = v_0 \hat{\mathbf{n}}_i + \mu \sum_j \mathbf{f}_{ij}$$

$$\dot{\theta}_i = \frac{1}{\tau} (\theta_i^v - \theta_i) + \eta_i(t)$$



f_{ij} pair repulsive forces:



*Szabó et al, PRE 74, 06918 (2006)

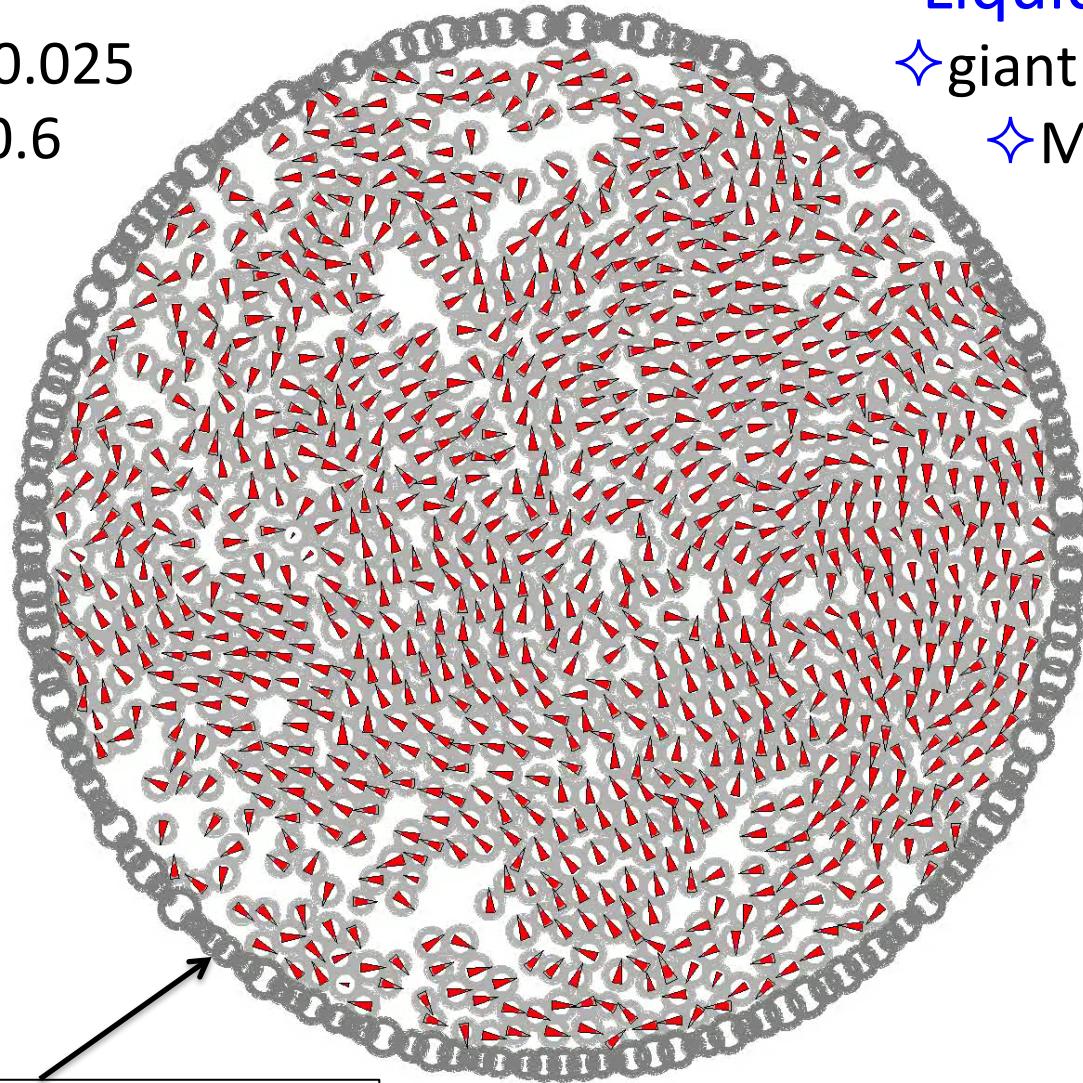
❑ Add **polydispersion** as size variation is needed to yield glass in 2d repulsive soft disks → passive limit is the granular jamming transition

❑ Add **confinement** to disable global translation

“Liquid” state:

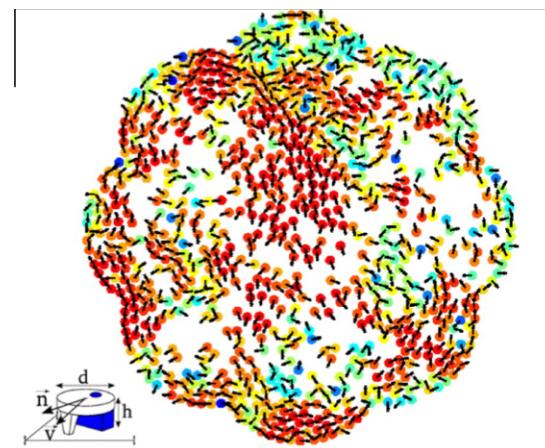
- ❖ giant number fluctuations
- ❖ MSD ballistic at all times

$v_0=0.025$
 $\varphi=0.6$



BC: row of soft spheres
“glued” to the box
boundary

Velocity scale:
red arrow=diameter $\rightarrow v=v_0$



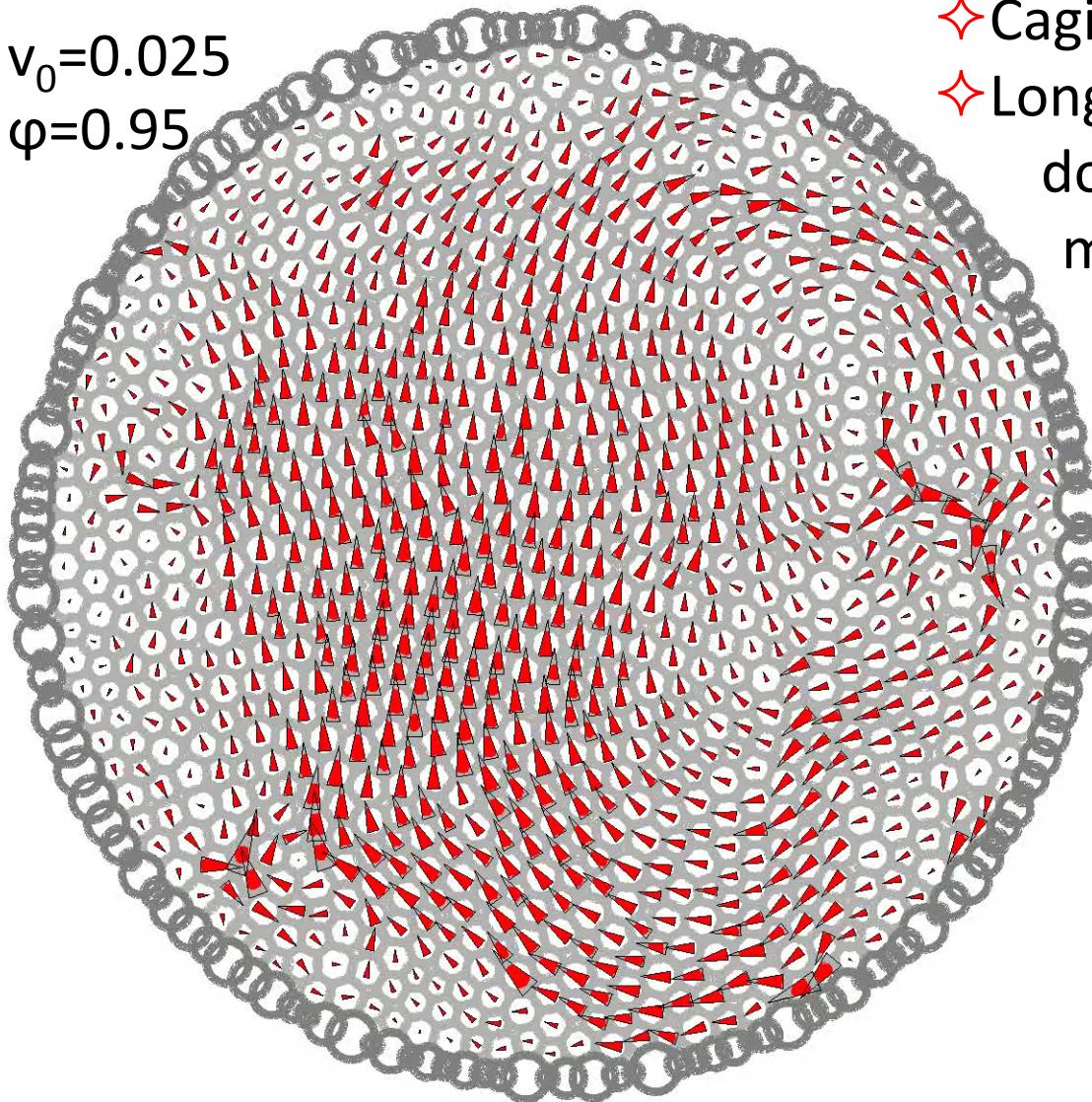
Deseigne et al, PRL2010

“Glass” or “jammed” state:

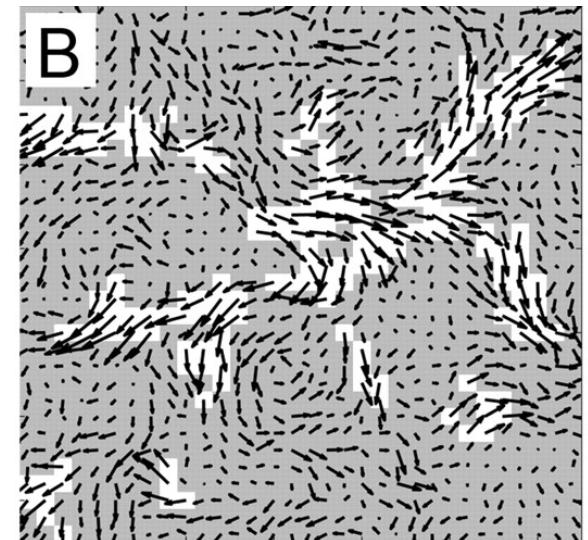
❖ Caging and oscillations

❖ Long time dynamics

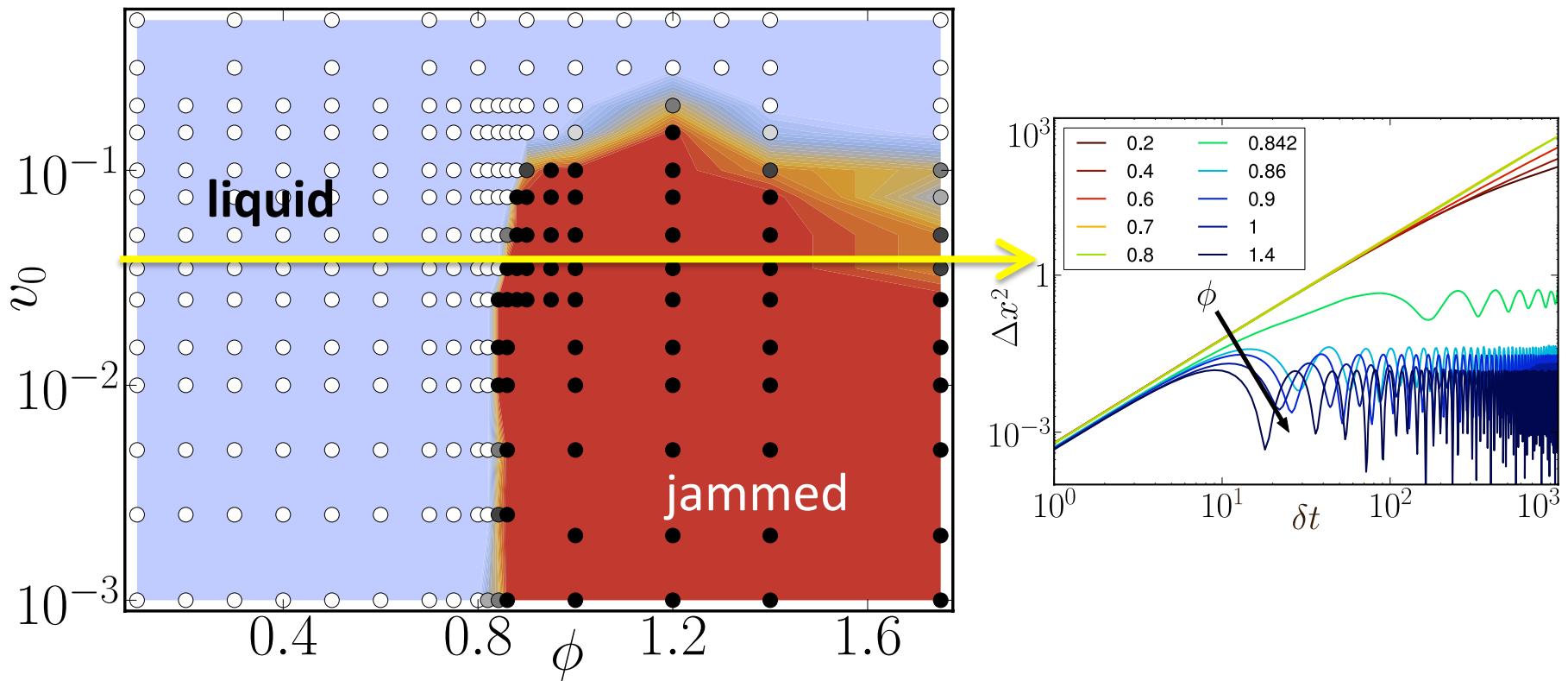
dominated by low frequency
modes of jammed soft disks



Angelini et al, PNAS 2011



Transition from an active fluid to an active glassy or jammed state with increasing packing fraction ϕ



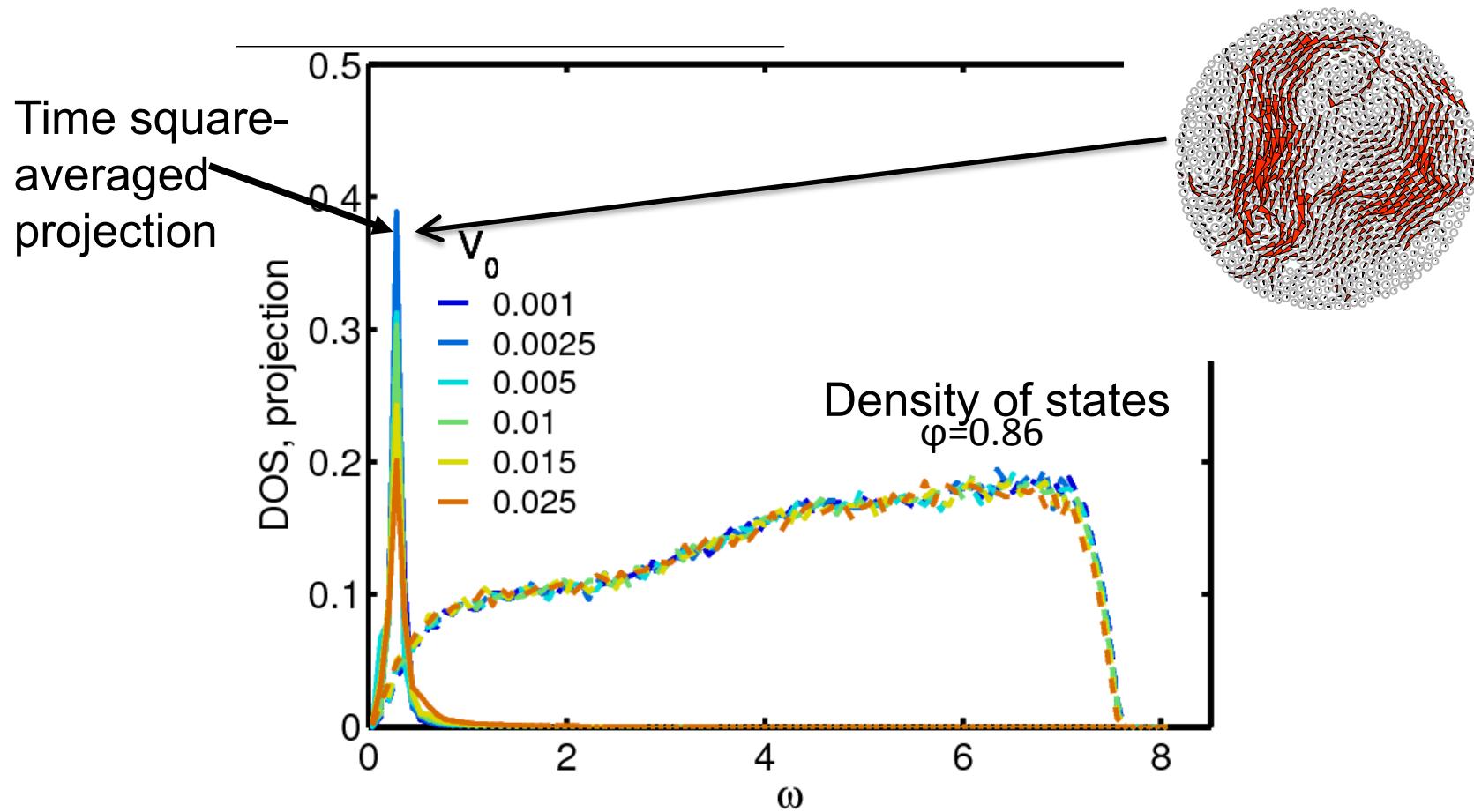
What are these oscillations?

- The system is in a glassy state; self-propulsion excites the collective low energy modes of the system.
- Although the dynamics is overdamped, the angular alignment time scale τ provides an “effective inertia”
- Can study the low frequency modes analytically by expanding around jammed state
- Energy is not distributed by equipartition, but cascades into low energy modes

Low-energy “phonons” control the dynamics at long times

Energy is not distributed by equipartition, but cascades into low energy modes

very non-thermal → equipartition would lead to $\sim 1/\omega^2$



Final remarks

- ❑ Active systems are nonequilibrium systems where the drive acts on each unit, not applied at the boundary or via an external field.
- ❑ They include living and synthetic systems and span many scales.
- ❑ Collectives of interacting, active entities (motor-filament complexes, bacteria, cells, synthetic swimmers, birds,...) as a new kind of ‘Active Matter’ with novel states and properties.
- ❑ Progress in using active matter paradigm to model behavior of living matter.

MCM, Joanny, Ramaswamy, Liverpool, Prost, Rao & Simha, *Hydrodynamics of Soft Active Matter*, Rev. Mod. Phys. **85**, 1143–1189 (2013)