
Active Matter in two dimensions

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Work in collaboration with

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D. Levis & I. Pagonabarraga (Barcelona, España & Lausanne, Suisse)

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Active matter

Definition

Active matter is composed of large numbers of active "agents", which consume energy and thus move or exert mechanical forces.

Due to the energy consumption, these systems are intrinsically out of thermal equilibrium.

Homogeneous energy injection (not from the borders, *cfr.* shear).

Coupling to the environment (bath) lets allows for dissipation

Active matter

Realisations & modelling

- Wide range of scales: macroscopic to microscopic

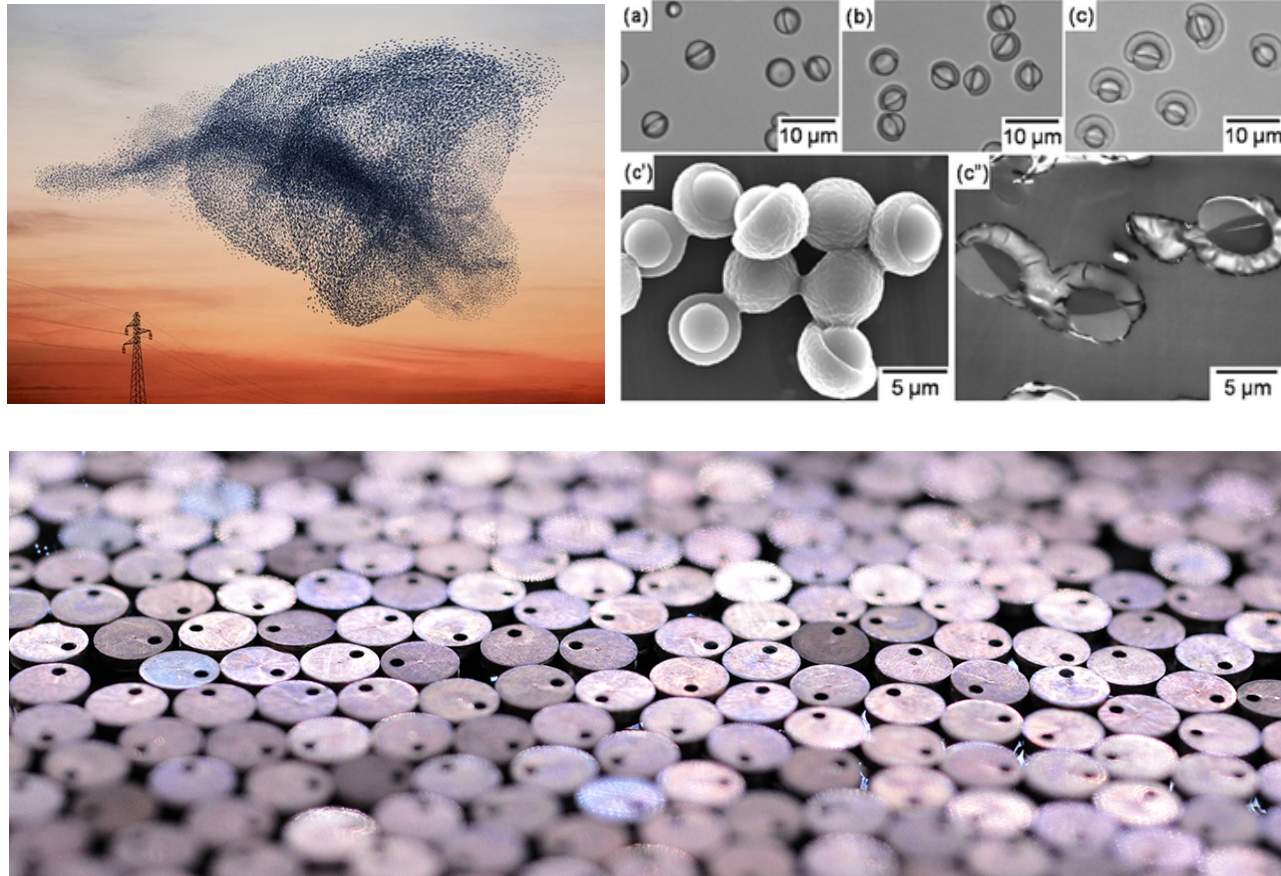
Natural examples are birds, fish, cells, bacteria.

Artificial realisations are Janus particles, asymmetric grains, toys, etc.

- Embedding spaces in $3d$, $2d$ and $1d$.
- Modelling: very detailed to coarse-grained or schematic:
 - microscopic or *ab initio* with focus on active mechanism,
 - *mesoscopic*, just forces that do not derive from a potential,
 - *Cellular automata* like in the Vicsek model.

Active matter

Natural & artificial systems



Experiments & observations **Bartolo et al.** Lyon, **Bocquet et al.** Paris, **Cavagna et al.**

Roma, **di Leonardo et al.** Roma, **Dauchot et al.** Paris, just to mention some Europeans

Active matter

Realisations & modelling

- Wide range of scales: macroscopic to microscopic

Natural examples are birds, fish, cells, bacteria.

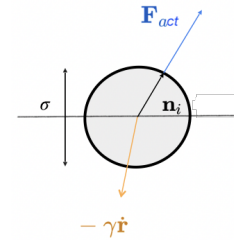
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Active Brownian Disks in $2d$

(Overdamped) Langevin equations (the standard model)

Active force \mathbf{F}_{act} along $\mathbf{n}_i = (\cos \theta_i, \sin \theta_i)$



$$m\ddot{\mathbf{r}}_i + \gamma\dot{\mathbf{r}}_i = F_{\text{act}}\mathbf{n}_i - \nabla_i \sum_{j(\neq i)} U_{\text{Mie}}(r_{ij}) + \boldsymbol{\xi}_i, \quad \dot{\theta}_i = \eta_i,$$

\mathbf{r}_i position of i th particle & $r_{ij} = |\mathbf{r}_i - \mathbf{r}_j|$ inter-part distance,

U_{Mie} short-range **repulsive** Mie potential, over-damped limit $m \ll \gamma$

$\boldsymbol{\xi}$ and η zero-mean Gaussian noises with

$$\langle \xi_i^a(t) \xi_j^b(t') \rangle = 2\gamma k_B T \delta_{ij}^{ab} \delta(t - t') \text{ and } \langle \eta_i(t) \eta_j(t') \rangle = 2D_\theta \delta_{ij} \delta(t - t')$$

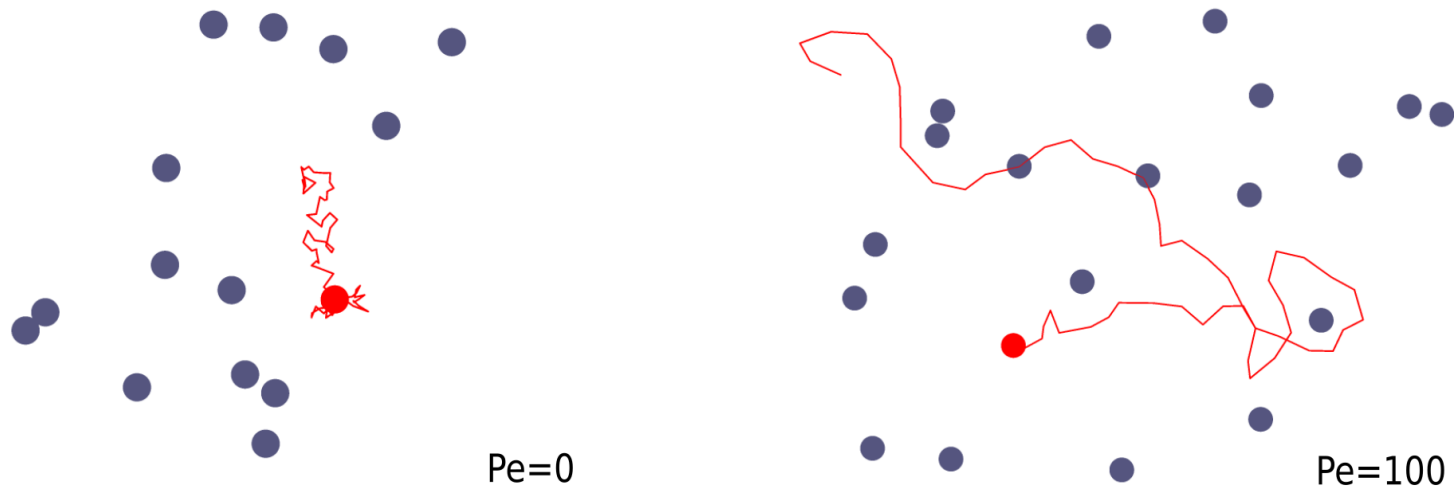
The units of length, time and energy are given by σ , $\tau_p = D_\theta^{-1}$ and ε

$D_\theta = 3k_B T / (\gamma\sigma^2)$ controls persistence, $\gamma/m = 10$ and $k_B T = 0.05$

Péclet number $\text{Pe} = F_{\text{act}}\sigma / (k_B T)$ and $\phi = \pi\sigma^2 N / (4S)$, measures activity

Active Brownian disks

The typical motion of particles in interaction



The active force induces a persistent random motion due to

$$\langle \mathbf{F}_{\text{act}}(t) \cdot \mathbf{F}_{\text{act}}(t') \rangle \propto F_{\text{act}}^2 e^{-(t-t')/\tau_p}$$

with $\tau_p = D_{\theta}^{-1}$

Active Brownian disks

Questions

- Pe - ϕ Phase diagram
- Mechanisms for phase transitions.
- Topological defects.
- Dynamics across phase transitions.
- Motility Induced Phase Separation.
 - Influence of particle shape, *e.g.* disks vs. dumbbells.

Active Brownian disks

Questions

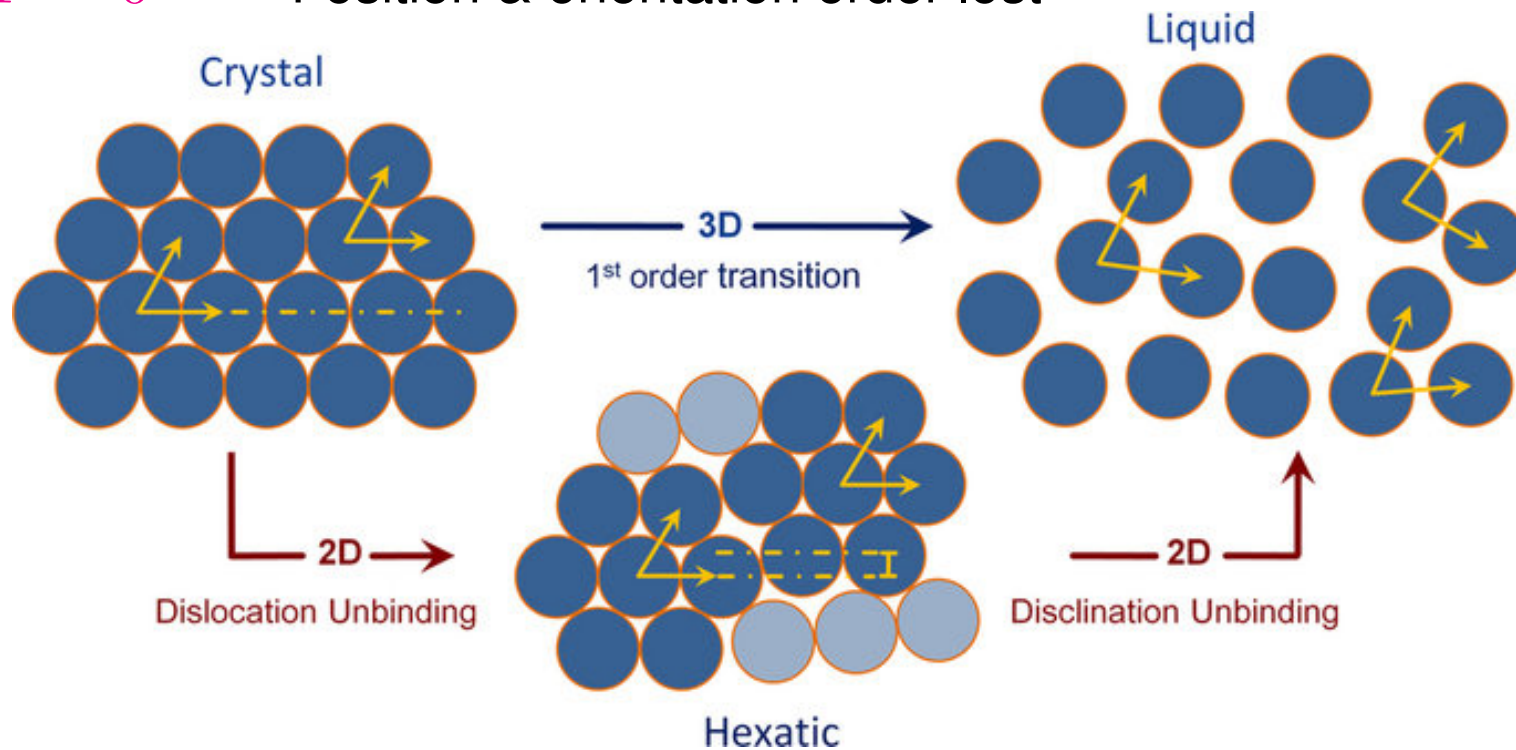
- $Pe - \phi$ Phase diagram – start from solid and dilute
- Mechanisms for phase transitions.
- Topological defects.
- Dynamics across phase transitions.
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Freezing/Melting

Two step route in passive $Pe = 0$ $2d$ systems

$T = 0$

Position & orientation order lost

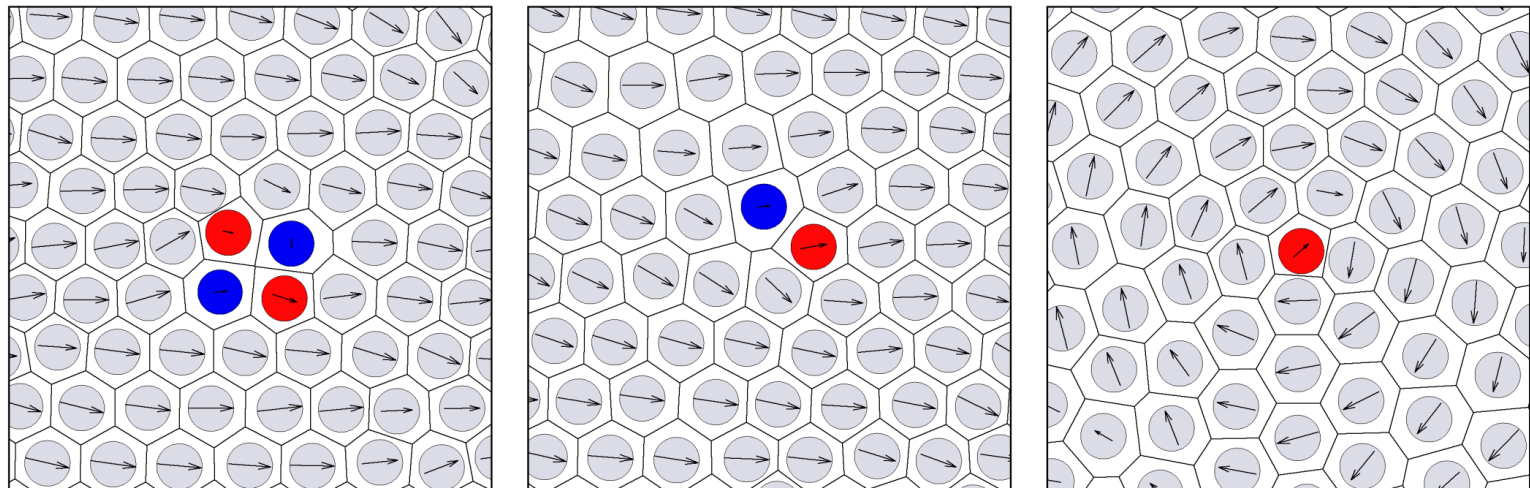


Orientation order preserved

also lost

Freezing/Melting

Hexatic (orientational) order $\psi_{6j} = n n_j^{-1} \sum_{k=1}^{n n_j} e^{i6\theta_{jk}}$



arrows oriented (LR) less oriented (QLR) order lost (SRL)

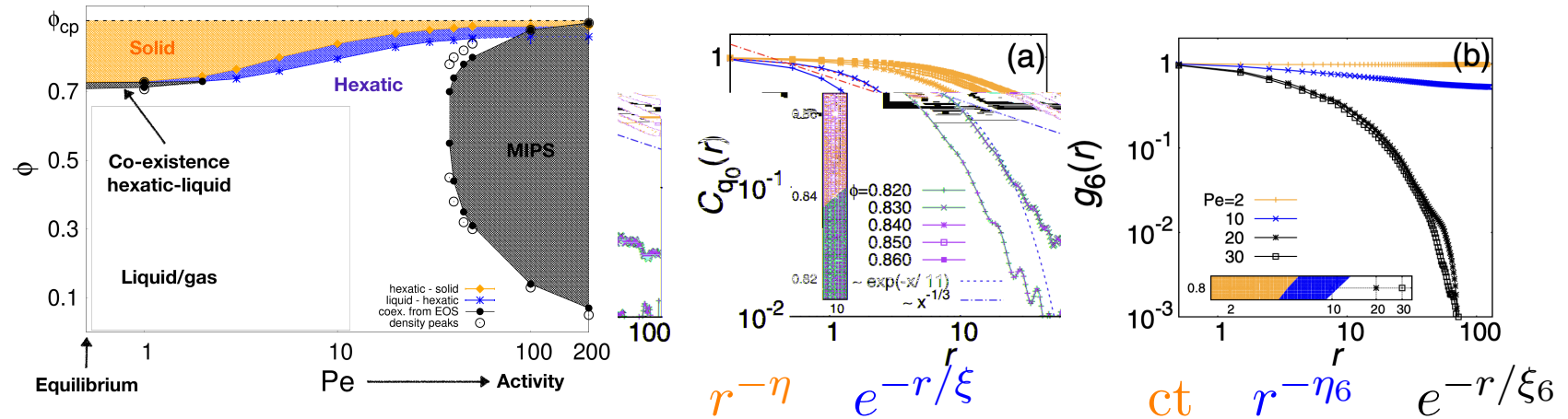
● five neighbours

● seven neighbours

Voronoi tessellation

Phase Diagram

Solid, hexatic, liquid, co-existence and MIPS



First order **liquid** - **hexatic** transition & co-existence at low Pe from

Pressure $P(\phi, Pe)$ (EoS)

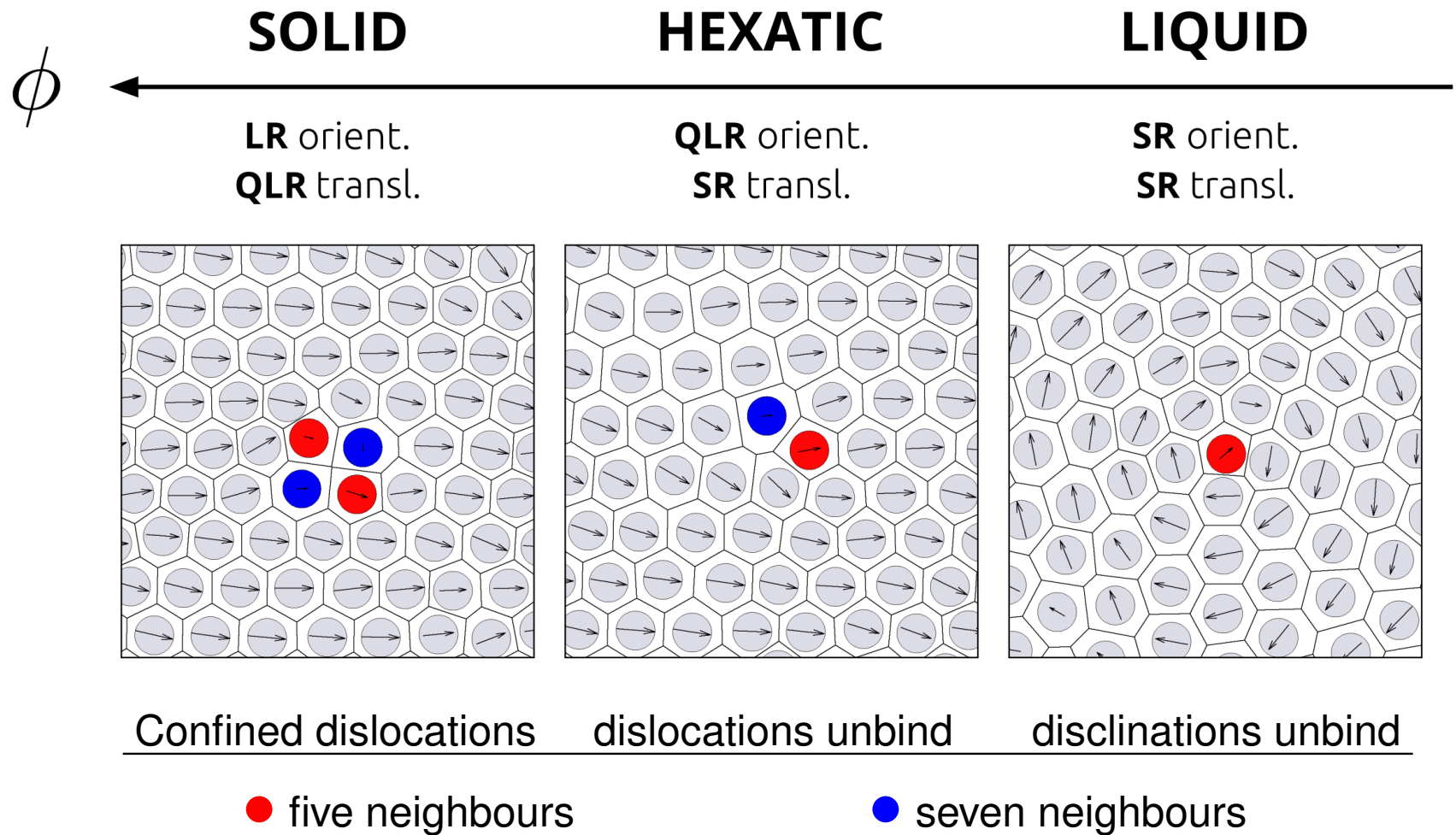
Distributions of ϕ_i and $|\psi_{6i}|$

Phases characterized by

Translational correlations $C_{q_0}(r)$ & orientational order correlations $g_6(r)$

Freezing/Melting

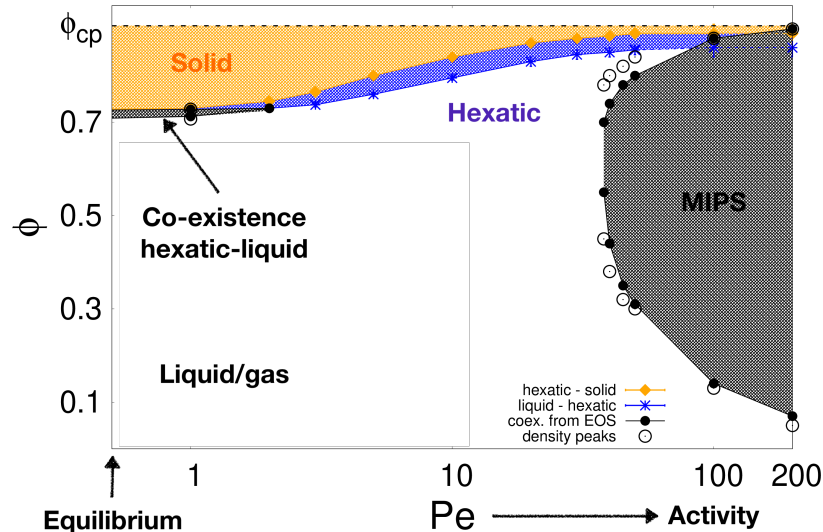
Mechanisms in $2d$ passive systems : defects



Voronoi tessellation

Active Brownian disks

Phase diagram with **solid**, **hexatic**, **liquid**, co-existence and MIPS



1st order **hexatic-liquid** close to $Pe = 0$

KT-HNY **solid-hexatic** dislocation unbinding

disclination unbinding in liquid

percolation of defect clusters in liquid

Pressure $P(\phi, Pe)$ (EOS), correlations $C_{q_0}(r)$, $g_6(r)$, and distributions of ϕ_i , $|\psi_{6i}|$
defect identification & counting

Digregorio, Levis, Suma, LFC, Gonnella & Pagonabarraga, PRL 121, 098003 (2018)

Digregorio, Levis, LFC, Gonnella & Pagonabarraga, Soft Matter 18, 566 (2022)

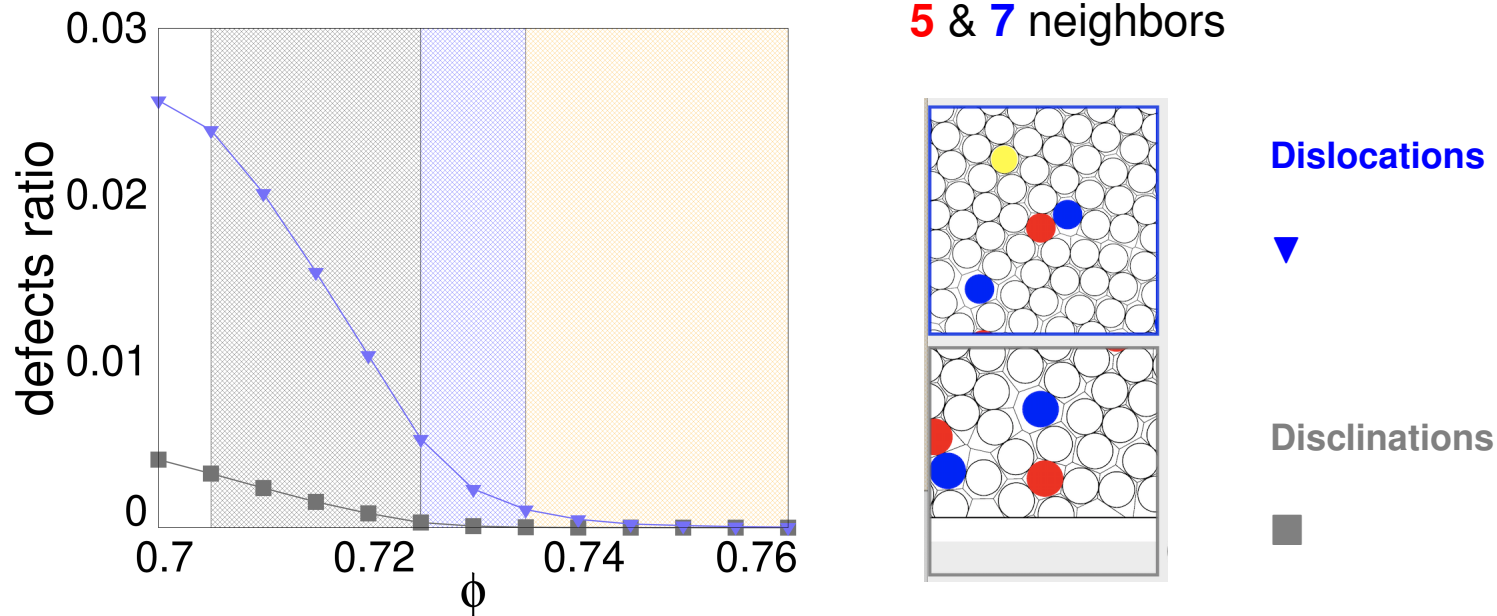
Topological defects

Summary of results

- **Solid - hexatic** à la BKT-HNY even quantitatively (ν value) and independently of the activity (Pe) *Universality*
- **Hexatic - liquid** very few disclinations and not even free.
Breakdown of the BKT-HNY picture for all Pe (even zero)
- Close to, but in the liquid, **percolation** of *clusters of defects* with properties of uncorrelated critical percolation (d_f, τ)
- In **MIPS**, network of defects on top of the interfaces between hexatically ordered regions, interrupted by the *gas bubbles in cavitation*

Mechanisms

Unbinding of defects ?



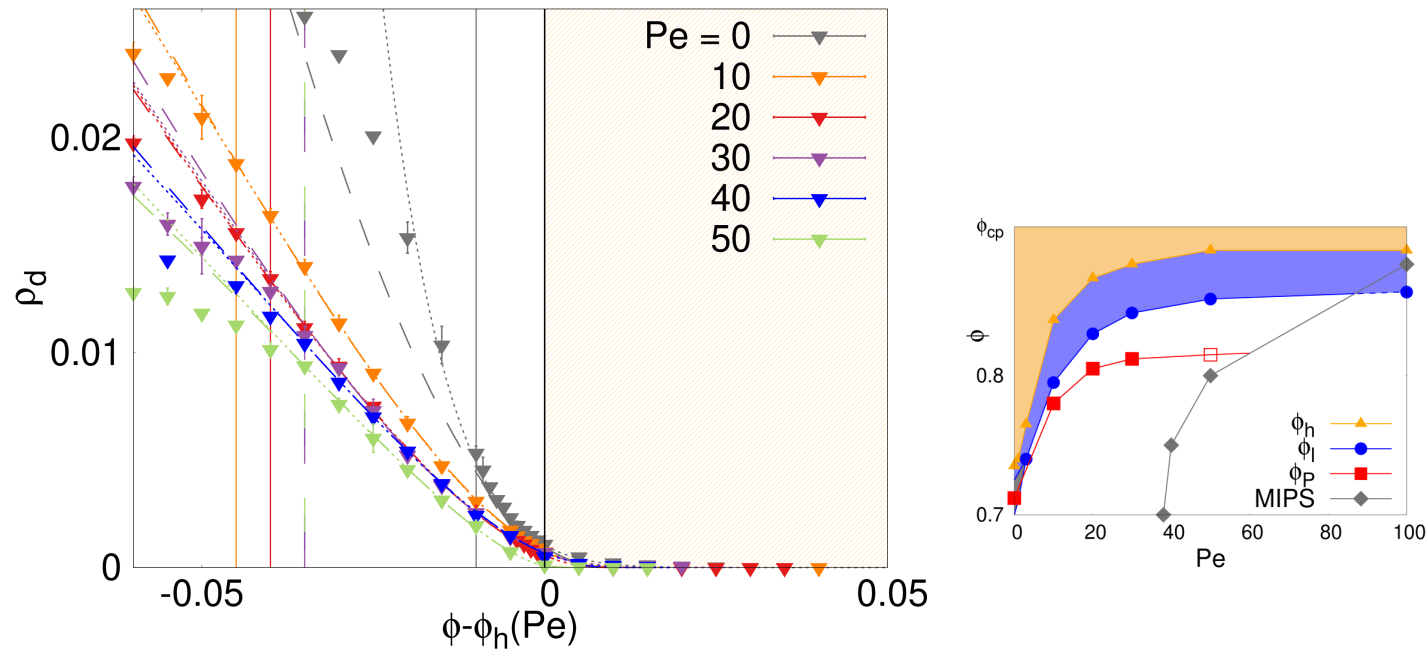
Dislocations ▼ unbind at the **solid** - **hexatic** transition as in BKT-HNY theory

$$\rho_{dislocations} \sim a \exp \left[-b \left(\frac{\phi_c}{\phi_c - \phi} \right)^\nu \right] \quad \nu \sim 0.37$$

Disclinations ■ unbind when the **liquid** appears in the co-existence region

Dislocations

At the **solid-hexatic** transition for all Pe $\nu = 0.37$ **Universality**



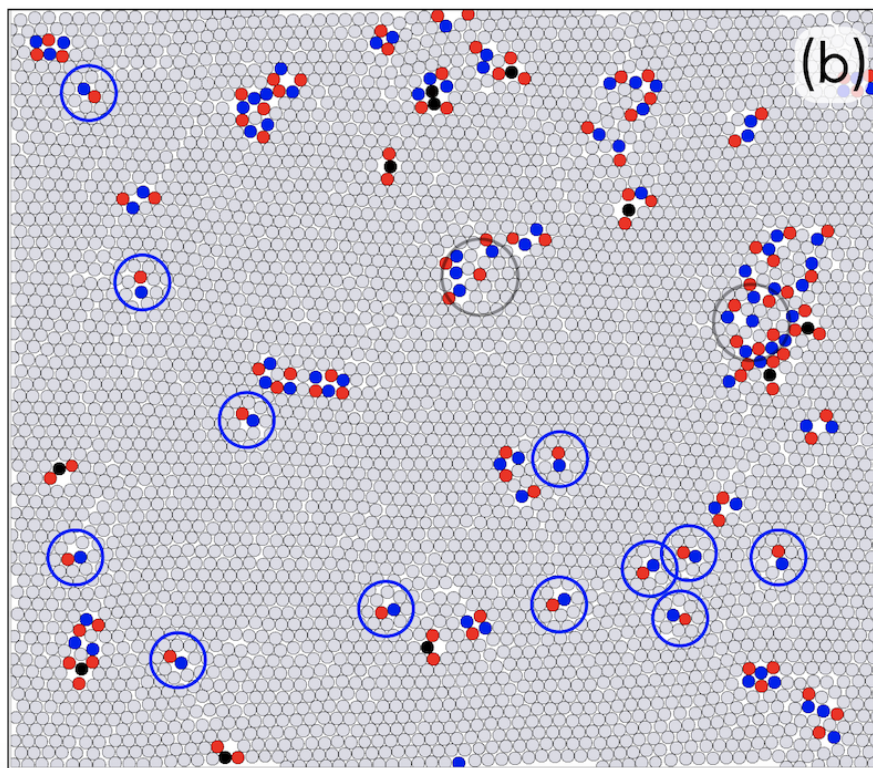
Four (ϕ_c, ν, a, b dotted) vs. three ($\phi_c, \nu = 0.37, a, b$ dashed) parameter fits on data in the hexatic & solid phases only. Criteria to support $\nu = 0.37$:

- χ^2
- not crazy values for a, b but crazy values for ν if let to be fitted
- difference between ϕ_c and ϕ_h erased by coarse-graining

cfr. Batrouni et al for 2dXY

Disclinations

At the hexatic - liquid transition ϕ_l at all Pe



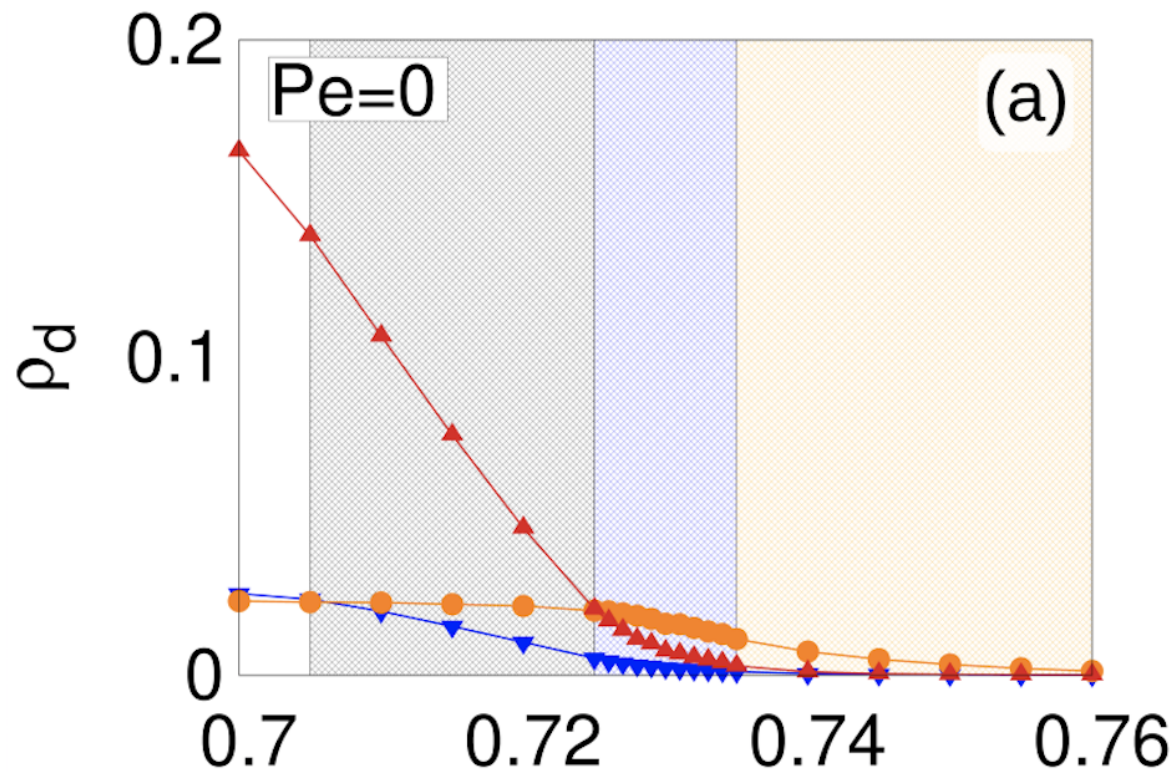
dislocations
disclinations

Very few disclinations, and always very close to other defects, so **not free**

Clusters

Close to the hexatic - liquid transition

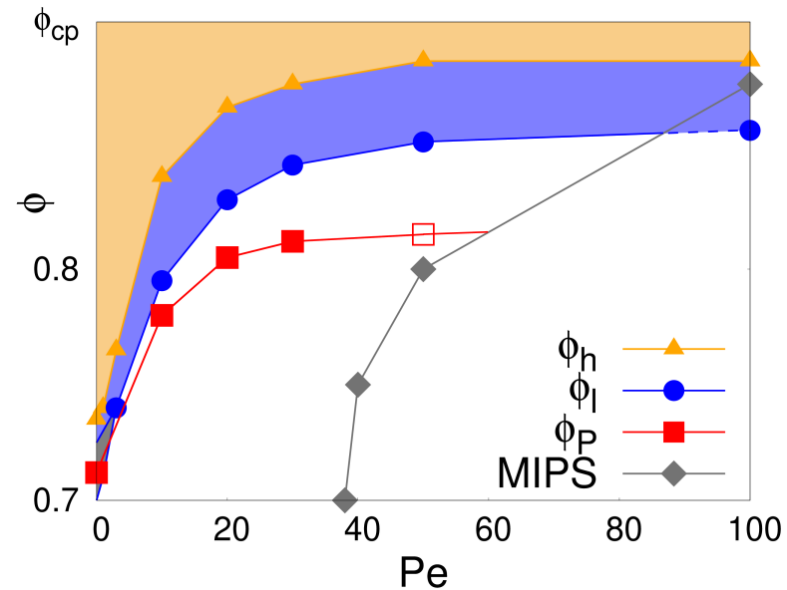
free dislocations  vacancies  clusters 



As soon as the liquid appears in co-existence, **defects in clusters dominate**

Clusters

Percolation of defect clusters: the critical curve



Critical percolation with

fractal properties $d_f \sim 1.9$ and

corresponding algebraic size distribution $\tau \sim 2.05$

With some coarse-graining the percolation curve moves upward towards the

hextic-liquid critical one

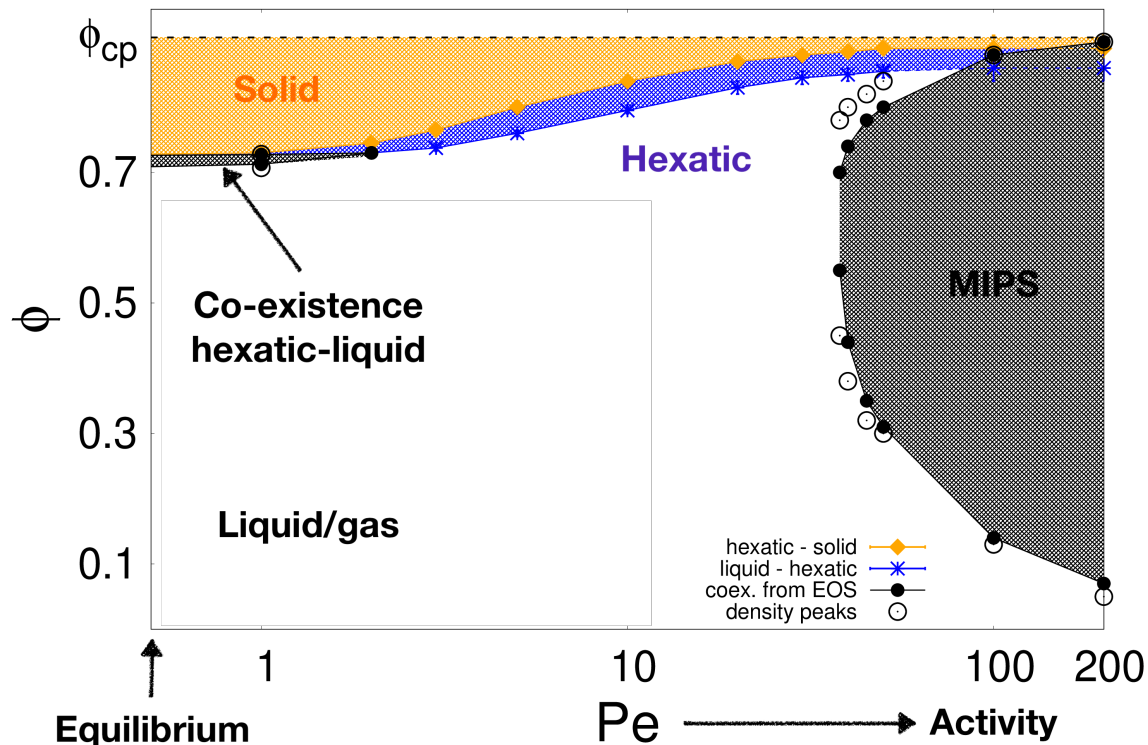
Active Brownian disks

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Active Brownian disks

Phase diagram with **solid**, **hexatic**, **liquid**, co-existence and MIPS



**Motility induced
phase separation (MIPS)
gas & dense**

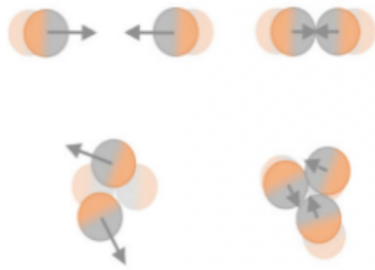
**Cates & Tailleur
Ann. Rev. CM 6, 219 (2015)
Farage, Krinninger & Brader
PRE 91, 042310 (2015)**

Pressure $P(\phi, Pe)$ (EOS), correlations $G_T(r)$, $G_6(r)$, and distributions of ϕ_i , $|\psi_{6i}|$

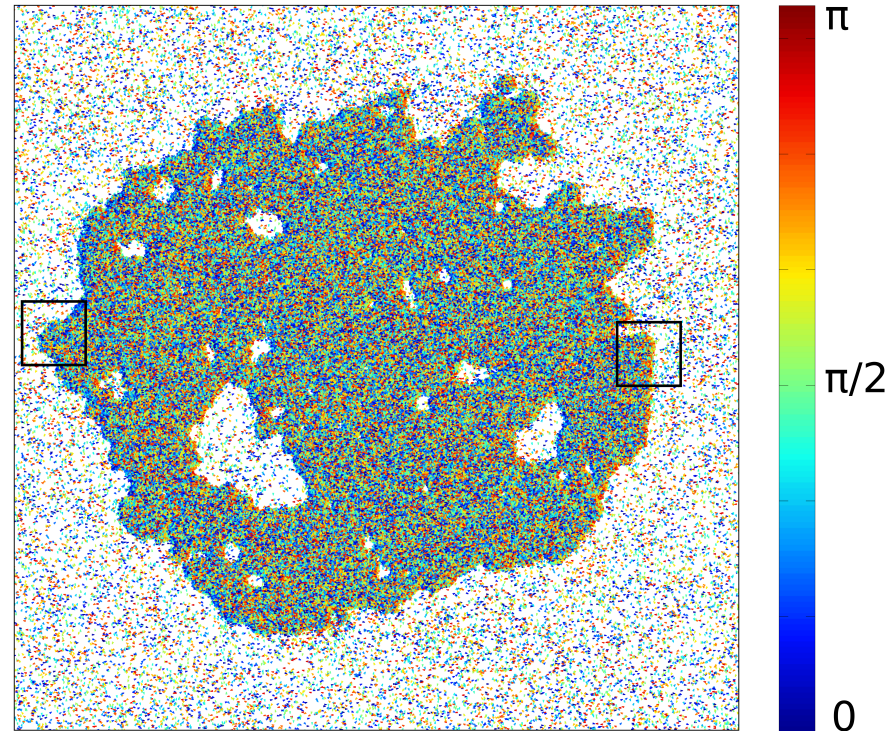
Digregorio, Levis, Suma, LFC, Gonnella & Pagonabarraga, PRL 121, 098003 (2018)

Motility Induced Phase Separation

The basic mechanism



Particles collide heads-on
and cluster even in the
absence of attractive forces



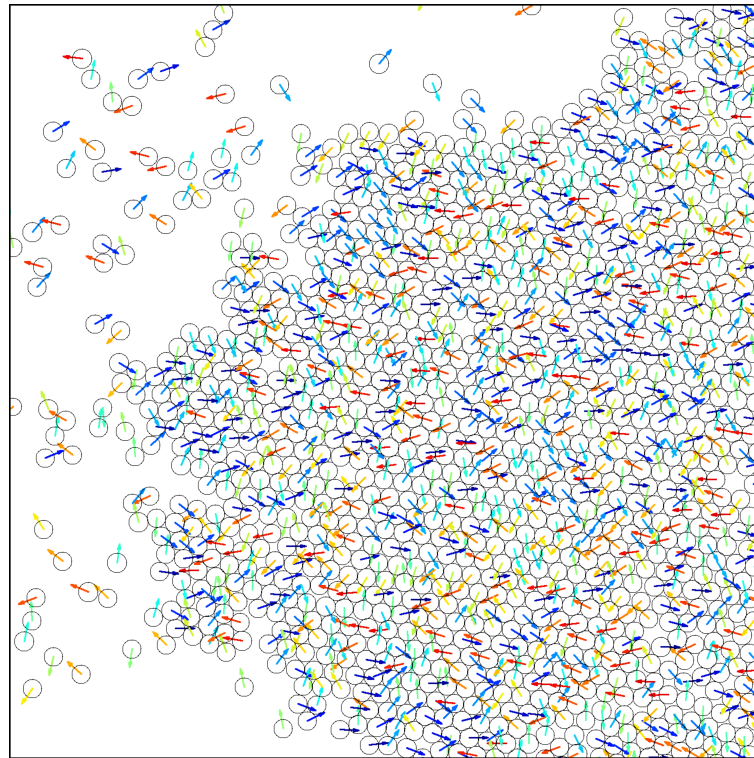
→ blue 0

← red π

The colours indicate the direction along which the particles are pushed by the active force F_{act}

MIPS

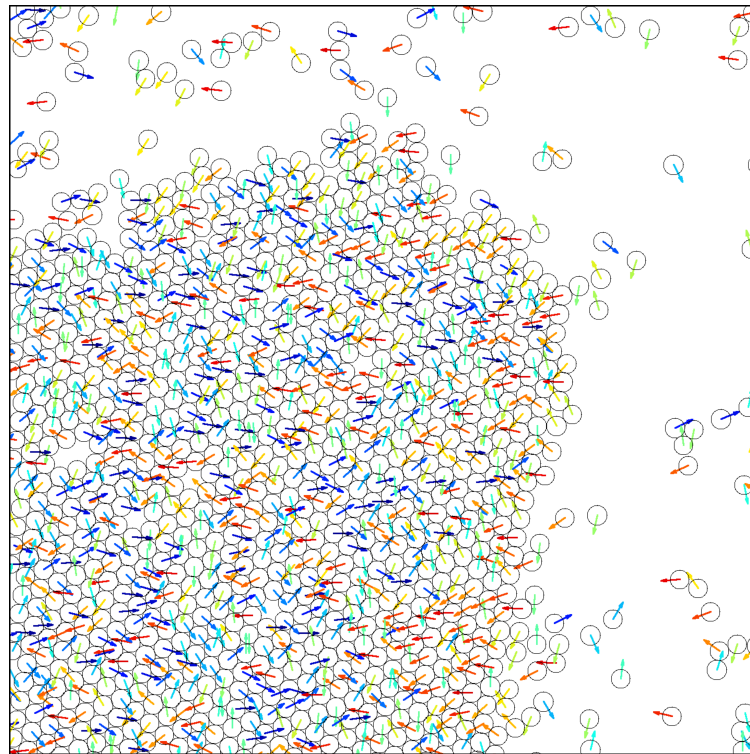
Particle orientation at the borders



Zoom over **left border** $\rightarrow 0$

MIPS

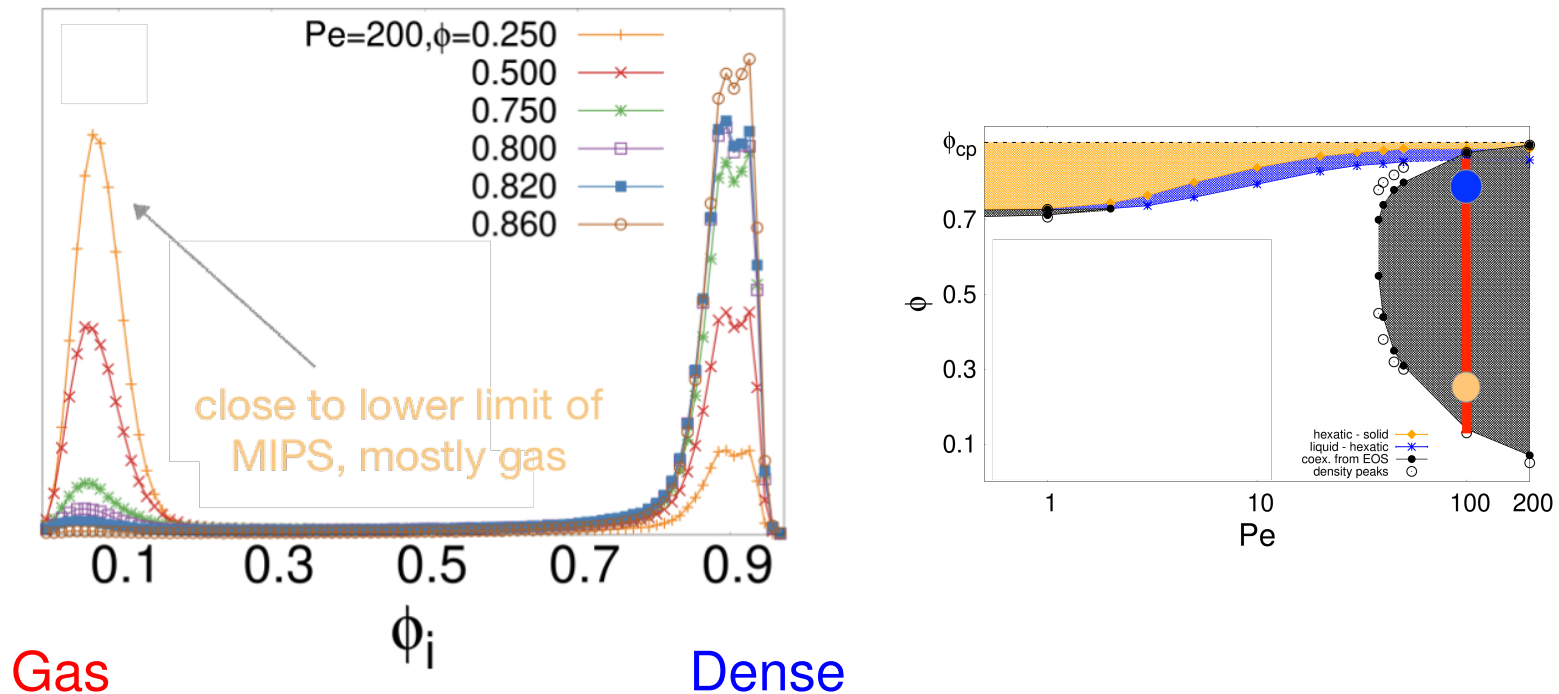
Particle orientation at the borders



Zoom over **right border** $\leftarrow \pi$

MIPS

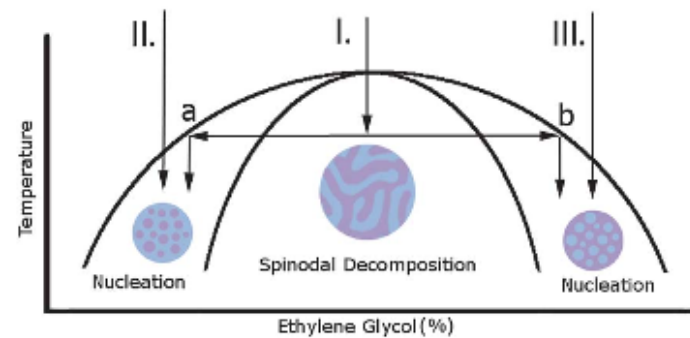
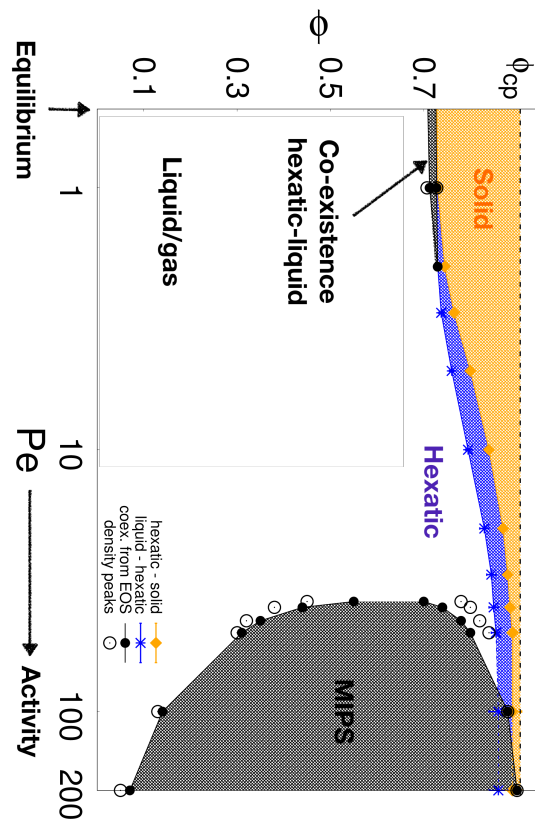
Local density distributions - dense & gas



The position of the peaks does not change while changing the global packing fraction ϕ but their relative height does. Transfer of mass from **gas** to **dense** component as ϕ increases

MIPS

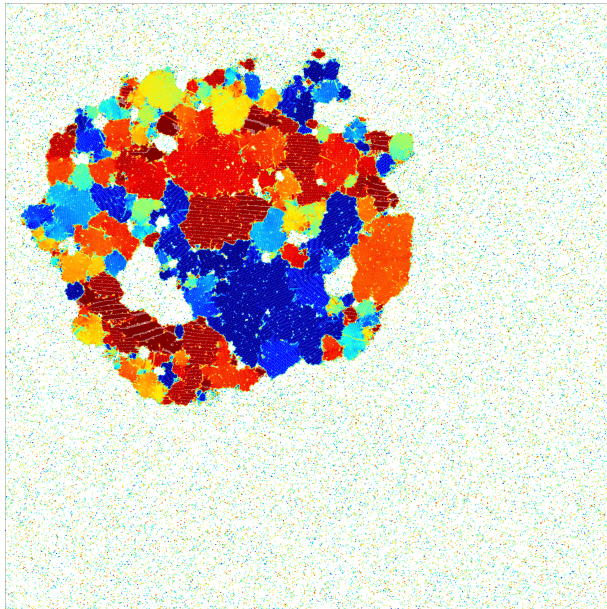
Is it just a conventional phase separation ?



Similar to phase separation with percentage of system covered by dense and gas phases determined by a level rule ?

The dense phase

Hexatic patches, defects, bubbles



Dense/dilute separation¹

For low packing fraction ϕ
a single round droplet

Growth^{2,3} of a mosaic of
hexatic orders³ with
gas bubbles^{3,4,5} & defects⁶

¹ Cates & Tailleur, Annu. Rev. Cond. Matt. Phys. 6, 219 (2015)

² Caporusso, Digregorio, LFC, Gonnella, Levis & Suma, in preparation

³ Caporusso, Digregorio, Levis, LFC & Gonnella, PRL 125, 178004 (2020)

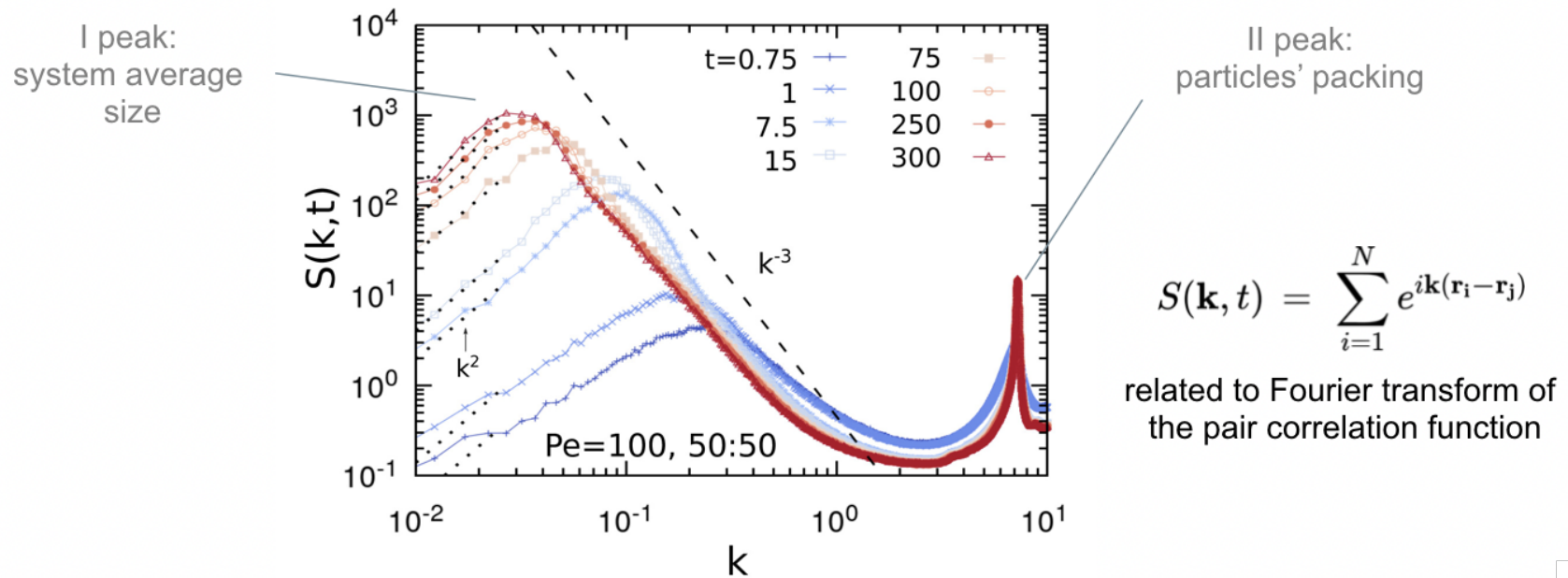
⁴ Tjhung, Nardini & Cates, PRX 8, 031080 (2018)

⁵ Shi, Fausti, Chaté, Nardini & Solon, PRL 125, 168001 (2020)

⁶ Digregorio, Levis, LFC, Gonnella & Pagonabarraga, Soft Matter 18, 566 (2022)

Structure

Dynamic structure factor \Rightarrow growing length of dense component



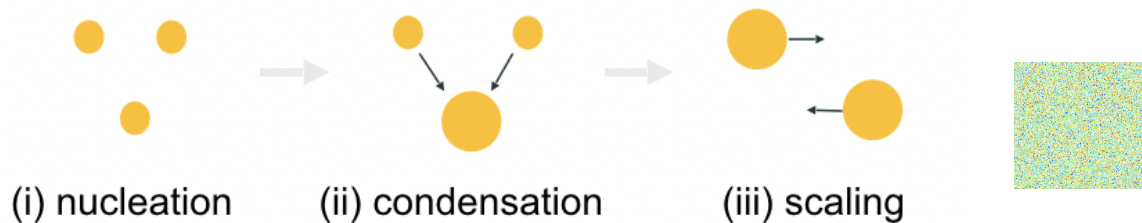
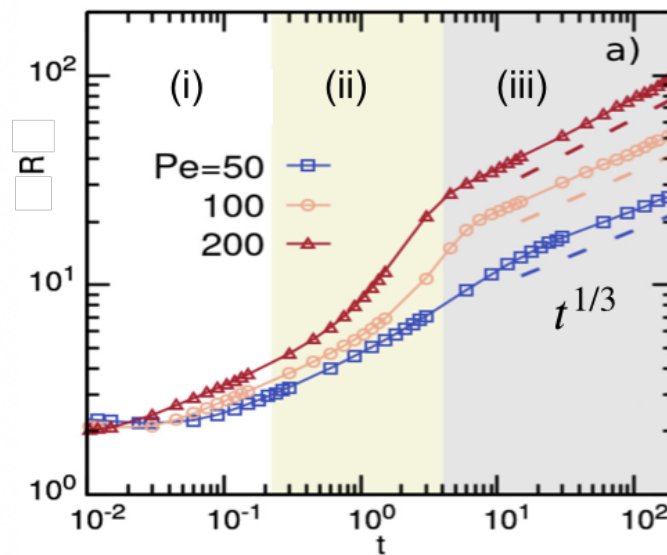
$$k_I(t) \propto R^{-1}(t)$$

No sign of fractality here. Porod's law $S(k) \sim k^{-(d+1)}$ for compact domains with sharp interfaces

The growth law

Growing length and regimes

Different Pe



In scaling regime $t^{1/3}$ like in **Lifshitz-Slyozov-Wagner**, scalar phase separation.

More about it & asymptotic value later

Internal structure

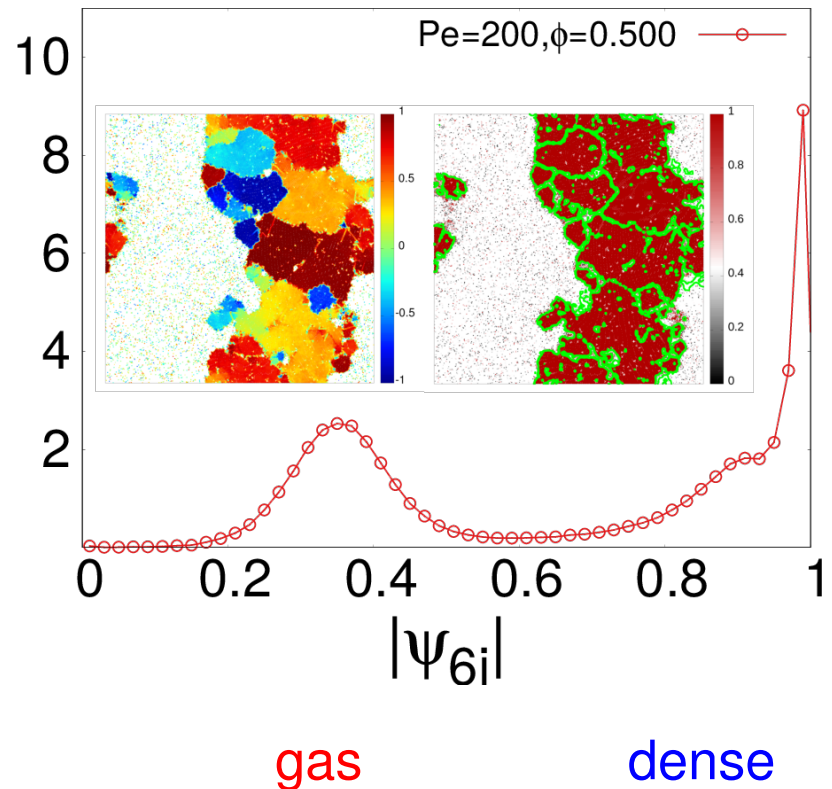
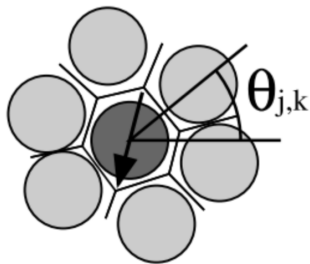
The coloured patches

Local hexatic order parameter video

Orientational order

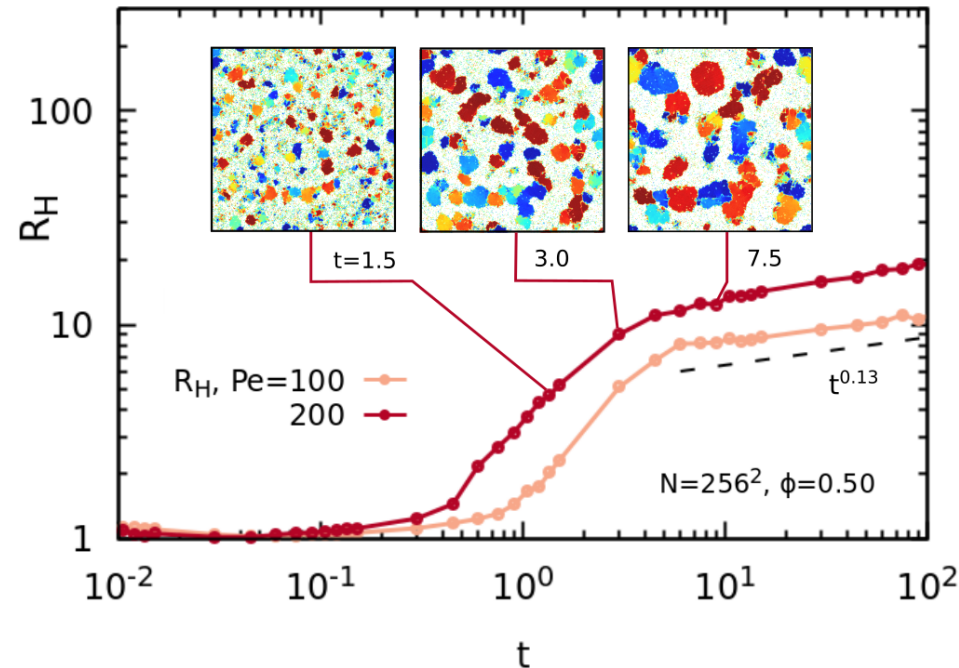
Local hexatic order parameter

$$\psi_{6j} = \frac{1}{nn_j} \sum_{k=1}^{nn_j} e^{i6\theta_{jk}}$$



Local hexatic order

Regimes



Full hexatically ordered small clusters

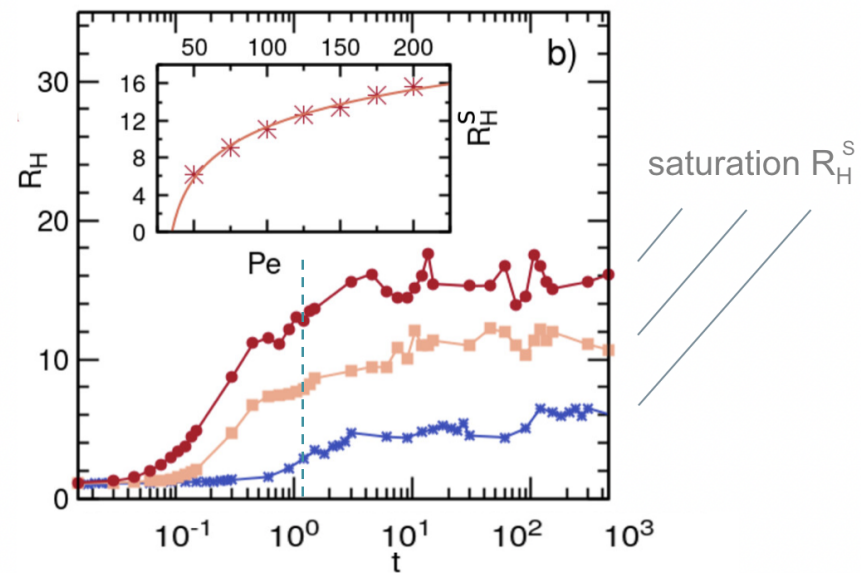
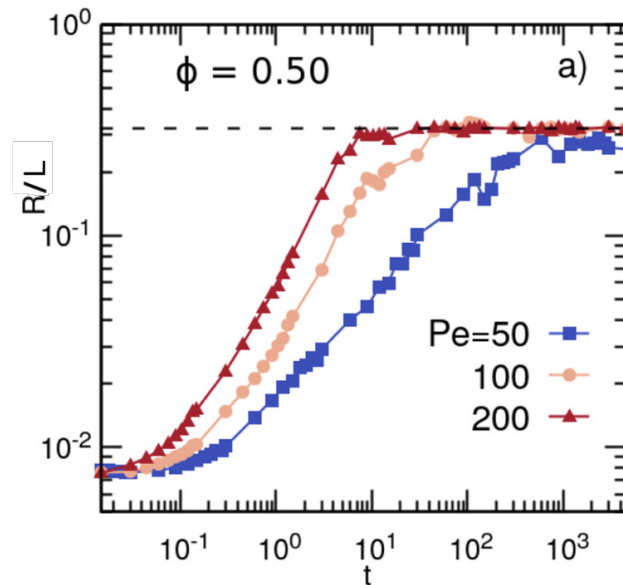
Larger clusters with several orientational order within

$R_H \sim t^{0.13}$ in the scaling regime and $R_H \rightarrow R_H^s \ll L$

Similar to pattern formation, e.g. Vega, Harrison, Angelescu, Trawick, Huse, Chaikin & Register, PRE 71 061803 (2005)

Macro vs. micro

Dense phase vs. hexatic growth



$$R(t) \rightarrow aL$$

$$R_H(t) \rightarrow R_H^s \text{ finite}$$

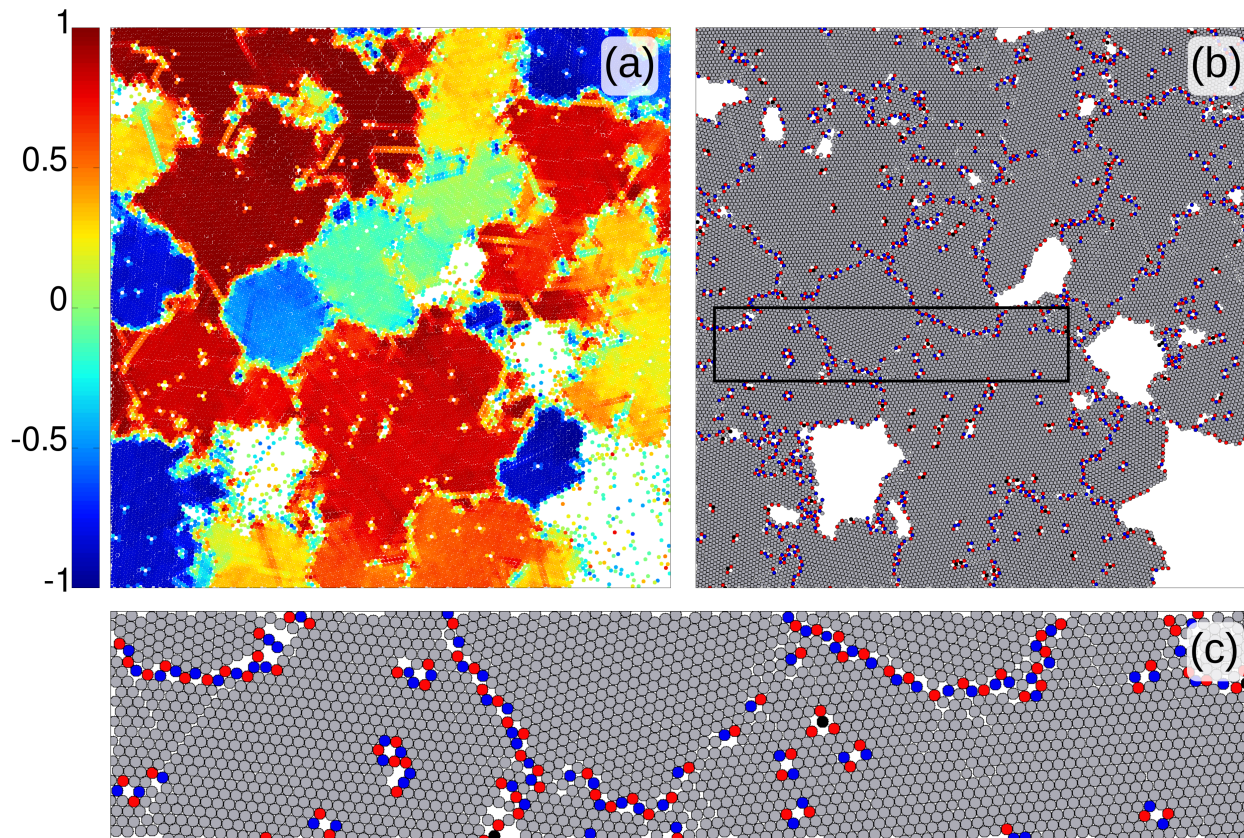
\sim Exponential distribution of hexatic cluster sizes

Interfaces

Clusters of defects – mostly along hexatic-hexatic interfaces

Hexatic order map

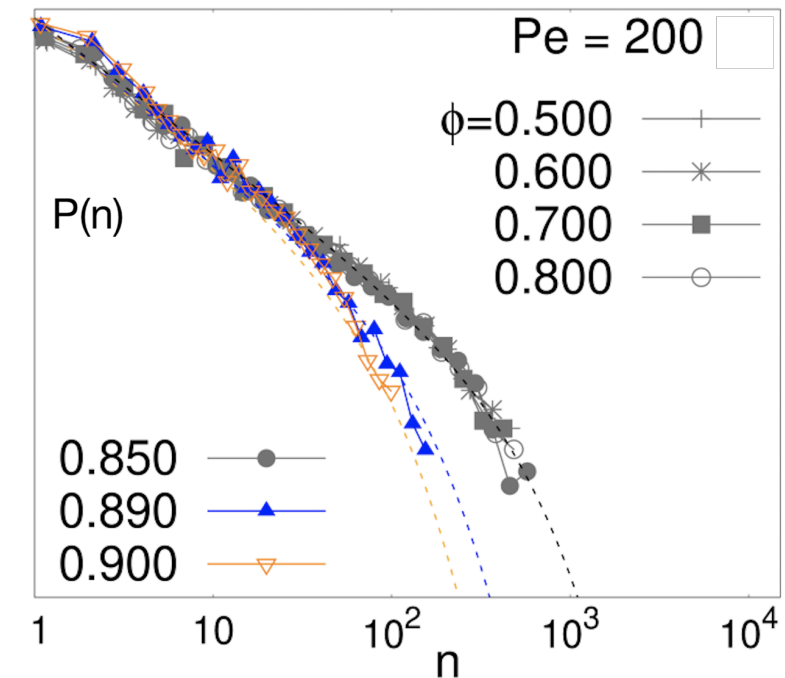
Defects



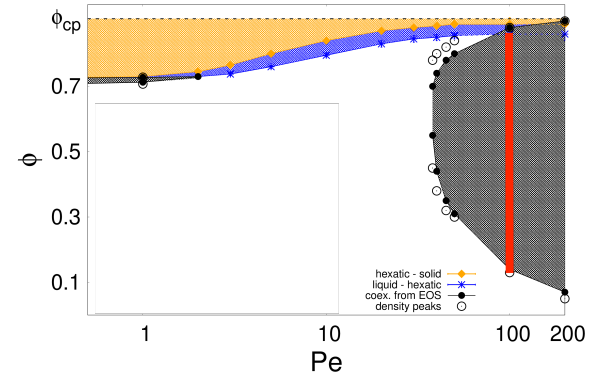
Zoom over the rectangular selection

Clusters of defects

Size distribution - Finite size cut-off



$$P(n) \simeq n^{-\tau} e^{-n/n^*}$$

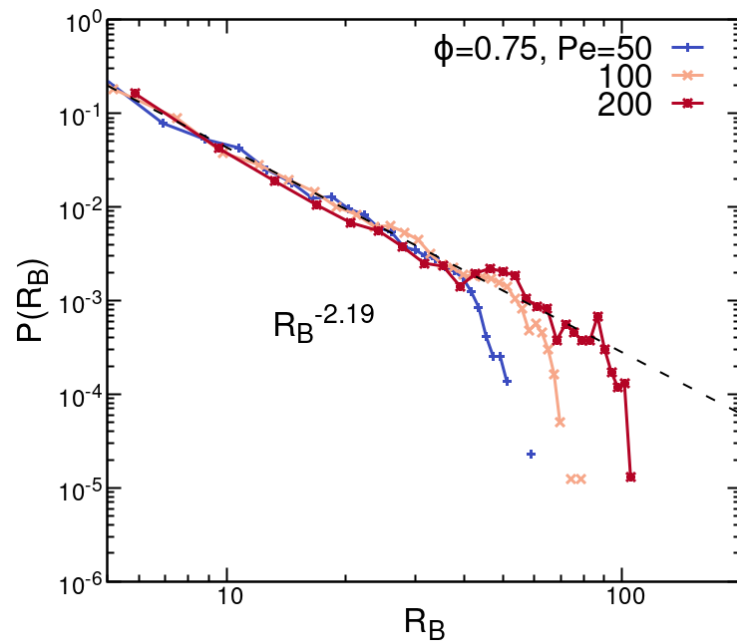
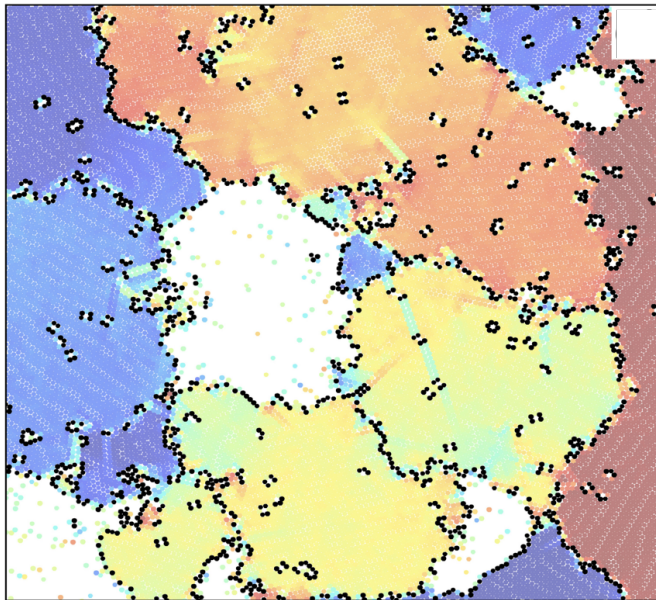


Independence of ϕ at fixed Pe within MIPS

$n^* \sim 30, 50, 200$ in the **solid**, **hexatic** and **MIPS**, respectively, and $\tau \sim 2.2$

Bubbles in cavitation

At the internal interfaces bubbles pop up



Bubbles appear and disappear at the interfaces between hexatic patches

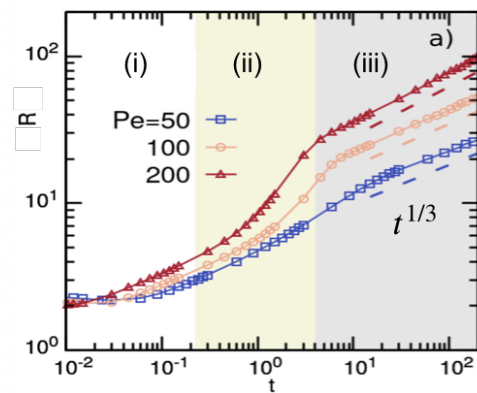
Algebraic distribution of bubble sizes with a Pe -dependent exponential cut-off

Growth of dense components

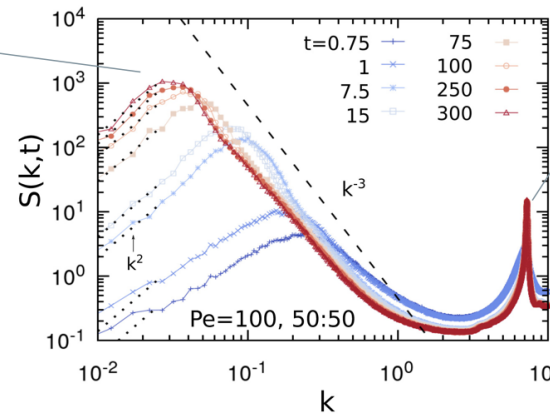
Growth of the dense phase

Scaling of the structure factor and growth regimes

Different Pe



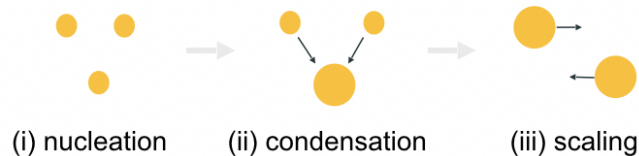
I peak:
system average
size



II peak:
particles' packing

$$S(\mathbf{k}, t) = \sum_{i=1}^N e^{i\mathbf{k}(\mathbf{r}_i - \mathbf{r}_j)}$$

related to Fourier transform of
the pair correlation function



$$S(k, t) \sim R(t)^d f(kR(t))$$

$$R(t) \sim t^{1/3}$$

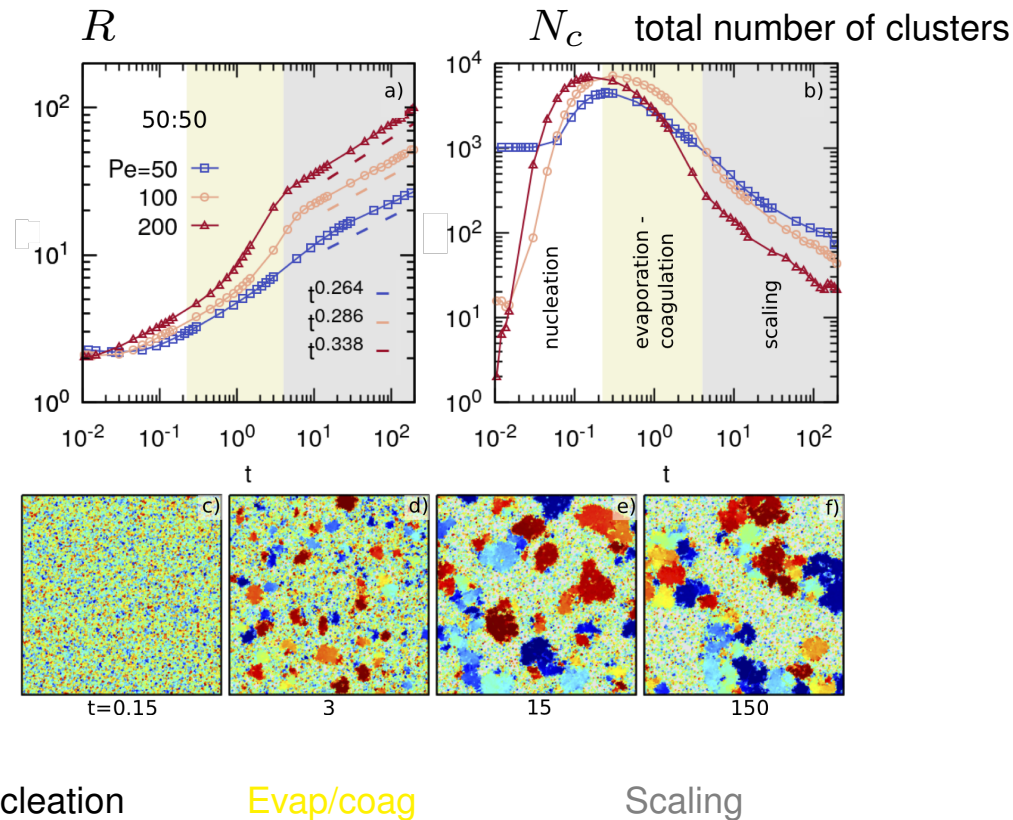
In the **scaling regime** $t^{1/3}$ like in **Lifshitz-Slyozov-Wagner**, scalar phase separation

Ostwald ripening small cluster evaporate and large ones capture gas particles

but is it just that ?

Growth of the dense phase

Focus on the clusters



On the averaged scaling regime:

Redner, Hagan & Baskaran, PRL 110, 055701 (2013)

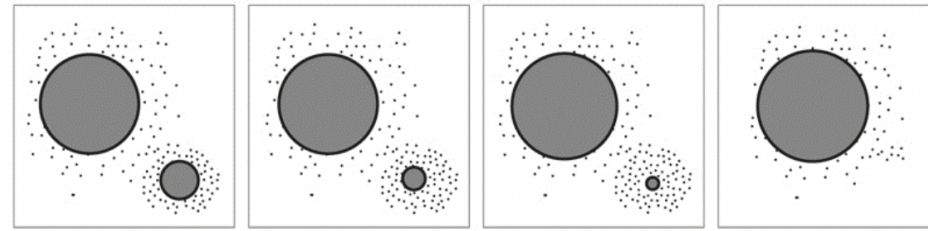
Stenhammar, Marenduzzo, Allen & Cates, Soft Matter 10, 1489 (2014)

Caporusso, Digregorio, Levis, LFC & Gonnella, PRL 125, 178004 (2020)

Beyond ?

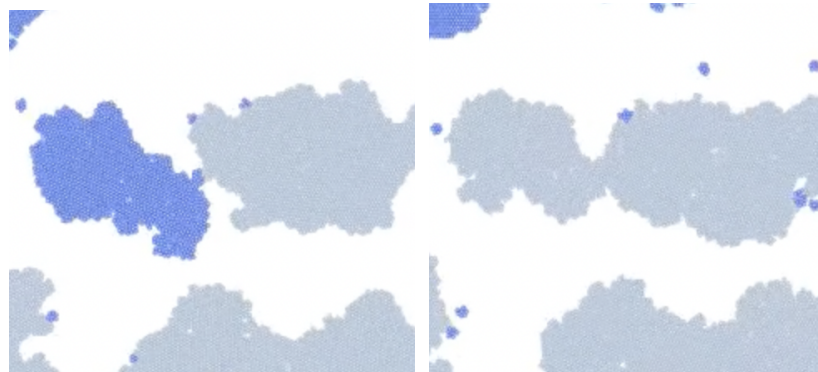
Goals:

1. Is it like the one undergone by a system of **passive attractive particles** ?



Ostwald ripening

2. Other **mechanisms** for the growth process ?

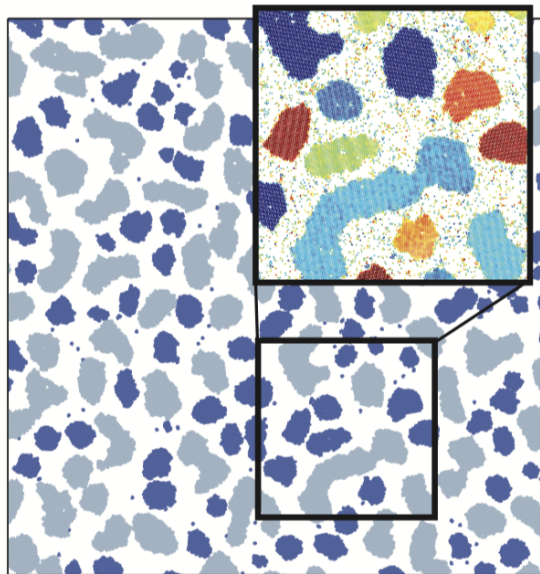


Cluster-cluster aggregation

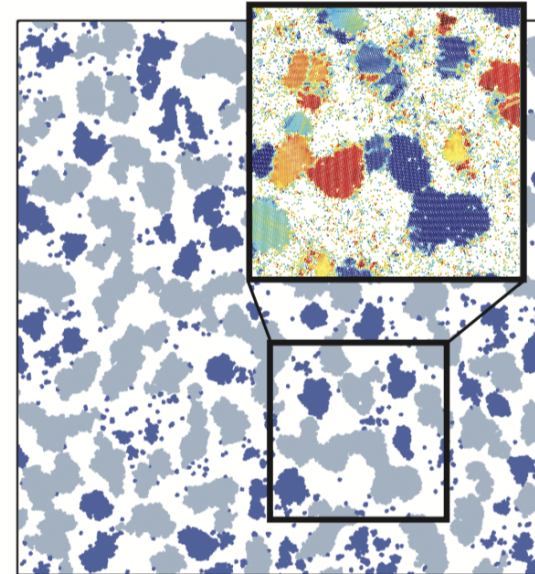
Dense clusters

Instantaneous configurations (DBSCAN)

Passive



Active



The Mie potential is not truncated in the passive case \Rightarrow attractive

Parameters are such that $R(t)$ is the same

Colors in the zoomed box indicate orientational order

Dense clusters

Visual facts about the instantaneous configurations

Similarities

- Large variety of shapes and sizes (masses)

Co-existence of

small regular (**dark blue**) and large elongated (**gray**) clusters

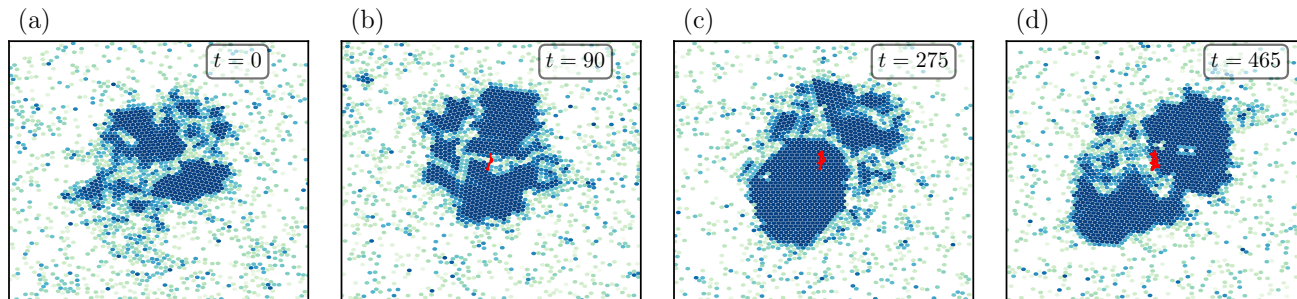
Differences

- Rougher interfaces in active
- Homogeneous (passive) vs. heterogeneous (active) orientational order within the clusters

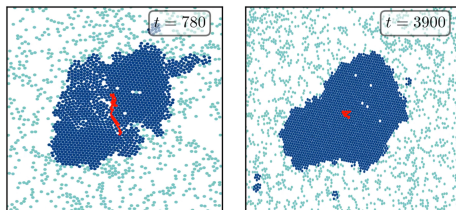
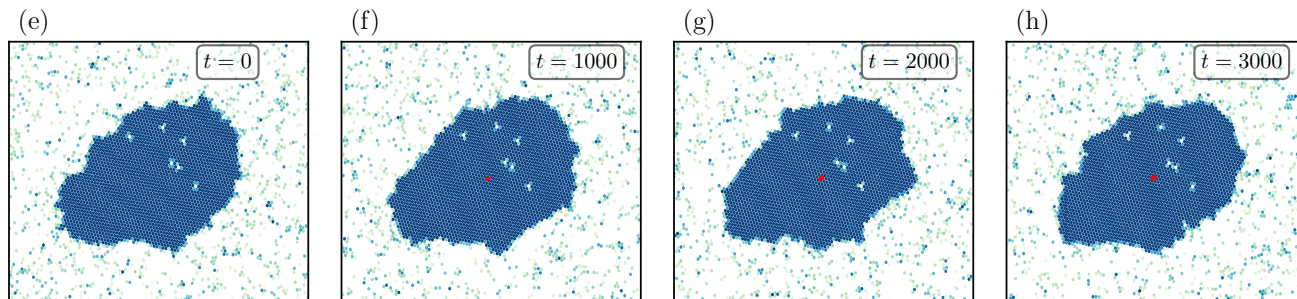
Cluster dynamics

Tracking of individual cluster motion - video

Active



Passive



In **red** the center of mass trajectory

Active is much faster than passive

Dense clusters

Visual facts about the cluster dynamics

In both cases, **Ostwald ripening** features

- small clusters evaporate
- gas particles attach to large clusters

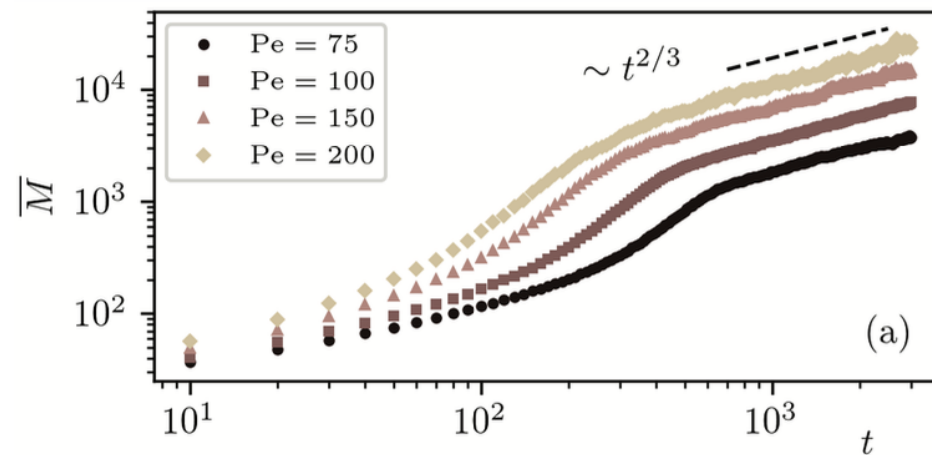
In the **active system**

- clusters displace much more & sometimes aggregate
- they also break & recombine

like in **diffusion limited cluster-cluster aggregation**

Dense clusters

Averaged mass $\bar{M} \equiv N_c^{-1}(t) \sum_{\alpha=1}^{N_c(t)} M_{\alpha}(t) \sim t^{2/3}$



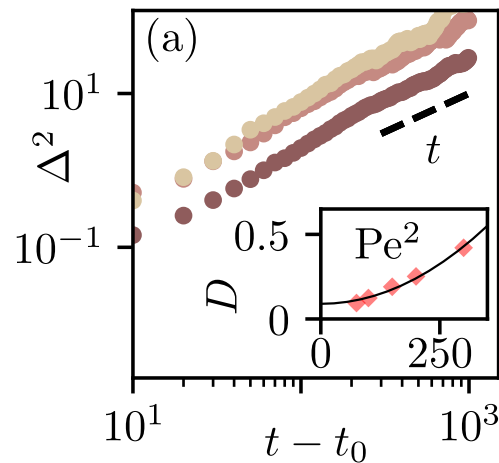
Same three regimes as in R from the structure factor

Clusters' dynamics origin ?

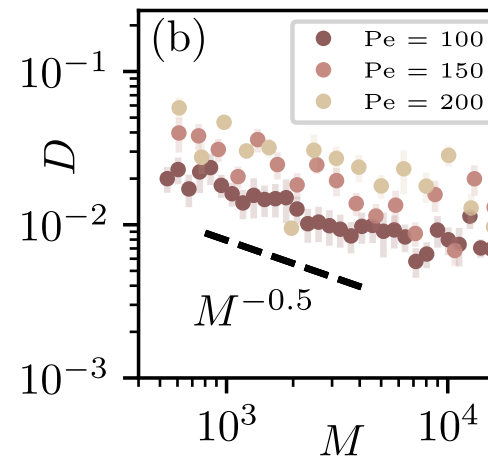
Active cluster evolution

Mean Square Displacement

Average over all clusters



Mass dependence



$$\Delta_k^2(t, t_0) = [\mathbf{r}_{\text{c.o.m.}}^{(k)}(t) - \mathbf{r}_{\text{c.o.m.}}^{(k)}(t_0)]^2 \sim 2d D(M_k, Pe) (t - t_0)$$

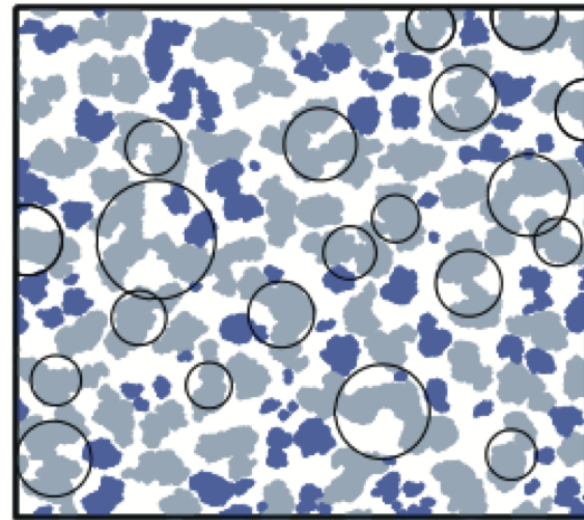
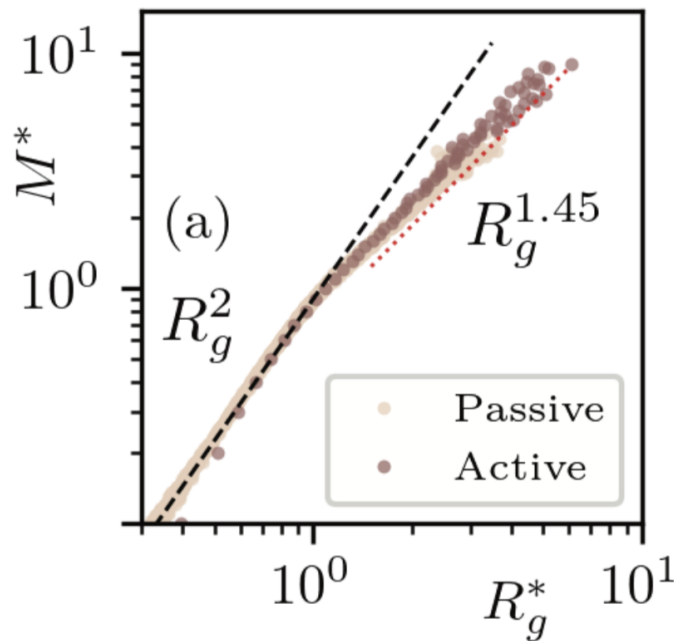
A sum of random forces yields $D \sim M^{-1}$

Passive tracer in a dilute active bath $D \sim R^{-1} \sim M^{-1/2}$ Solon & Horowitz (22)

Passive & very heavy isolated active clusters behave as $D \sim M^{-1}$

Geometry

Scatter plots: small regular – large fractal



$$\text{Cluster mass } M^*(t) = \frac{M_k(t)}{\overline{M}(t)}$$

$$\text{Gyration radius } R_g^*(t) = \frac{R_{gk}(t)}{R_g(t)}$$

Data sampled in the scaling regime $t = 10^3 - 10^5$ every 10^3 time steps

$$\overline{M}(t) = \frac{1}{N_c(t)} \sum_{k=1}^{N_c(t)} M_k(t) \text{ and } N_c(t) \text{ the total number of clusters at time } t$$

Cluster-cluster aggregation

Extended Smoluchowski argument

From $\bar{R}_g \sim t^{1/z}$ and using $D(M) \sim M^{-\alpha}$

Smoluchowski eq. $\Rightarrow z = d_f(1 + \alpha) - (d - d_w)$

Regular clusters $M < \bar{M}$

$$d_f = d = d_w = 2$$

$$\alpha = 0.5$$

$$z = 2(1 + 0.5) = 3$$

Fractal clusters $M > \bar{M}$

$$d_f = 1.45, d = 2 \text{ and } d_w \sim 2$$

$\alpha = 0.5$ in the bulk

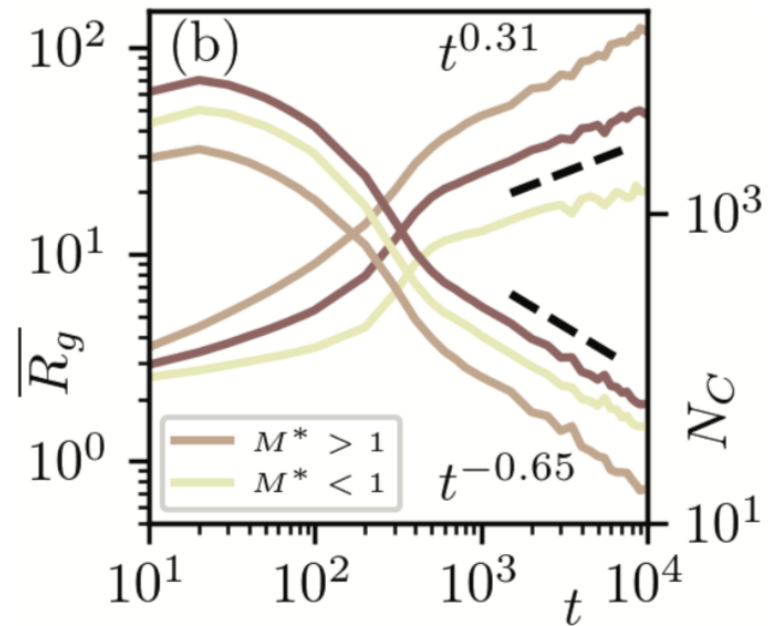
$$z = 1.45(1 + 0.5) = 2.18 < 3$$

Reviews on the application of fractals to colloidal aggregation

R. Jullien, Croatia Chemica Acta 65, 215 (1992) P. Meakin, Physica Scripta 46, 295 (1992)

Regular vs fractal clusters

Radius of gyration and number



regular $z \gtrsim 3$

More

Dominate

fractal $z < 3$

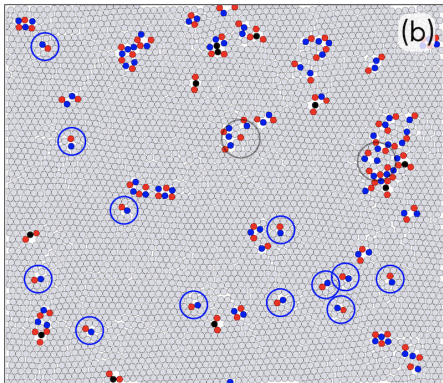
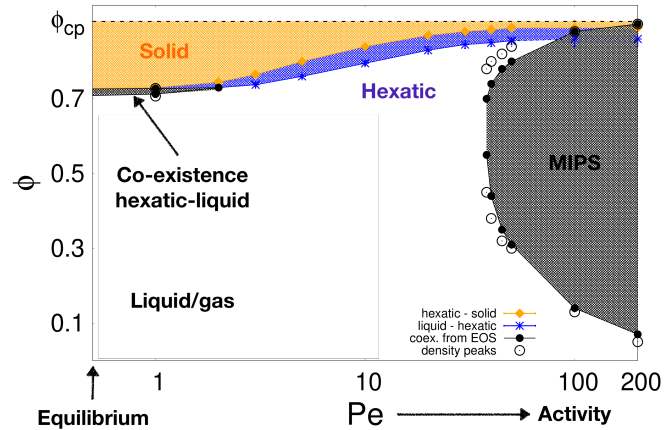
Less

average $z = 1/0.31 \sim 3$

All

Results I

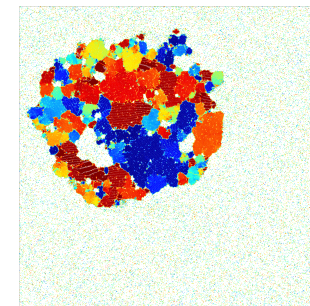
We established the full phase diagram of ABPs
solid, **hexatic**, **liquid** & MIPS



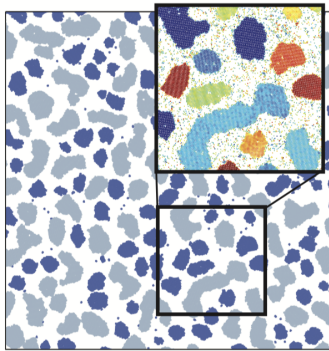
We clarified the role played by point-like
(**dislocations** & **disclinations**)
and **clustered** defects in
passive & active $2d$ models.

In MIPS

Micro vs. macro: hexatic patches & bubbles

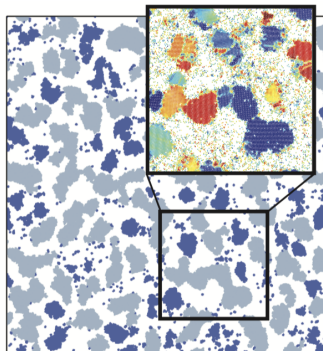


Results II



Difference between

Passive



Active

growth

Ostwald ripening & cluster-cluster aggregation in active case
cluster-cluster aggregation almost not present in passive

Co-existence of regular and fractal clusters

Heterogeneous orientational order in large active clusters

Cluster-cluster aggregation

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Smoluchowski eq. $\Rightarrow z = d_f(1 + \alpha) - (d - d_w)$

Regular clusters $M < \bar{M}$

$$d_f = d = d_w = 2$$

$$\alpha = 0.5$$

$$z = 2(1 + 0.5) = 3$$

Fractal clusters $M > \bar{M}$

$$d_f = 1.45, d = 2 \text{ and } d_w \sim 2$$

if, instead, $\alpha = 1$

$$z = 1.45(1 + 1) \sim 3$$

Reviews on the application of fractals to colloidal aggregation

R. Jullien, Croatia Chemica Acta 65, 215 (1992) P. Meakin, Physica Scripta 46, 295 (1992)