Active dumbbells

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Work in collaboration with

D. Loi & S. Mossa (Grenoble, France, 2007-2009) and

G. Gonnella, P. Di Gregorio, G.-L. Laghezza, A. Lamura, A. Mossa & A. Suma (Bari & Trieste, Italia, 2013-2017)

Problem & questions

From single to many-body

- How does an atypical force, the active force, alter the dynamics of an object (with a given form and mass distribution) immersed in a thermal bath, i.e. subject to friction → dissipation and thermal fluctuations → noise.
- Collective effects of an ensemble of such objects in interaction.
 - Dynamic phase transitions ? 3d vs. 2d ?
 - Active solid, liquid, gas phases?
 - Collective dynamics?

Some reviews : Fletcher & Geissler 09, Vicsek 10, Menon 10, Ramaswamy 10, Romanczuk et al 12, Cates 12, Marchetti et al. 13, de Magistris & Marenduzzo 15



- 1. Active Brownian dumbbells
- 2. Two-dimensional equilibrium phases

Passive limit: Beyond the BKT-Halperin-Nelson-Young scenario

3. Two-dimensional collective behaviour of active systems

No mobility induced phase transition (MIP)

Particles with shape

e.g., a diatomic molecule or a dumbbell : bacteria

Two spherical atoms with diameter $\sigma_{\rm d}$ and mass $m_{\rm d}$ Persistent force



Massless spring modelled by a finite extensible non-linear elastic (fene) force between the atoms $\mathbf{F}_{\mathrm{fene}} = -\frac{k(\boldsymbol{r}_i - \boldsymbol{r}_j)}{1 - r_{ij}^2/r_0^2}$

Additional repulsive contribution (WCA truncated Lennard-Jones potential) to avoid atomic/colloidal overlapping

Langevin dynamics

a passive dumbbell made of a colloid i and a colloid j

$$m_{\rm d} \ddot{\boldsymbol{r}}_i(t) = -\gamma \dot{\boldsymbol{r}}_i(t) + \mathbf{F}_{\rm pot_i}(\boldsymbol{r}_i, \boldsymbol{r}_j) + \boldsymbol{\eta}_i(t)$$

$$m_{\rm d} \ddot{\boldsymbol{r}}_j(t) = -\gamma \dot{\boldsymbol{r}}_j(t) + \mathbf{F}_{\rm pot_j}(\boldsymbol{r}_i, \boldsymbol{r}_j) + \boldsymbol{\eta}_j(t)$$

with $\mathbf{F}_{\mathrm{pot}} = \mathbf{F}_{\mathrm{wca}} + \mathbf{F}_{\mathrm{fene}}$, and

 $\eta_{i,j}$ independent thermal noises acting on the two beads, both with Gaussian statistics, zero average $\langle \eta_i^a(t) \rangle = 0$ at all times t, and δ -correlations $\langle \eta_i^a(t) \eta_j^b(t') \rangle = 2 \gamma k_B T \, \delta_{ij} \delta_{ab} \, \delta(t-t')$. Friction coefficient γ

i, j bead labels, $a, b = 1, \ldots, d$ coordinate labels

Single passive dumbbell

Elongation of the molecule

Almost rigid molecule for the parameters chosen (note the vertical scale)





Vibrations frozen

Langevin dynamics

a dumbbell under an active force

$$m_{d} \ddot{\boldsymbol{r}}_{i}(t) = -\gamma \dot{\boldsymbol{r}}_{i}(t) + \mathbf{F}_{\text{pot}_{i}}(\boldsymbol{r}_{i}, \boldsymbol{r}_{j}) + \mathbf{F}_{\text{act}} + \boldsymbol{\eta}_{i}(t)$$
$$m_{d} \ddot{\boldsymbol{r}}_{j}(t) = -\gamma \dot{\boldsymbol{r}}_{j}(t) + \mathbf{F}_{\text{pot}_{j}}(\boldsymbol{r}_{i}, \boldsymbol{r}_{j}) + \mathbf{F}_{\text{act}} + \boldsymbol{\eta}_{j}(t)$$

with $\mathbf{F}_{\mathrm{pot}} = \mathbf{F}_{\mathrm{wca}} + \mathbf{F}_{\mathrm{fene}}$

 $\eta_{i,j}$ independent thermal white noises acting on the two beads, and



Single active dumbbell

Sketch of position mean-square displacement : new scales

Ballistic t_I Diffusive $t^* = t_a/\text{Pe}^2$ Ballistic $t_a = D_R^{-1} = \gamma \sigma_d/(2k_BT)$ Diffusive



No $Pe = \sigma_d F_{act}/(k_B T)$ effect on the angular motion of an isolated dumbbell

Problem & questions

From single to many-body

• How does an atypical force, the active force, alter the dynamics of a particle (with a given form and mass distribution) immersed in a thermal bath, i.e. subject to friction \rightarrow dissipation and

thermal fluctuations \rightarrow noise

Mean-square displacements

• Collective effects of an ensemble of such objects in interaction.

- Dynamic phase transitions ? 3d vs. 2d ?
- Active solid, liquid, gas phases?
- Collective dynamics?

Interacting active dumbbells

Many-body interacting system

Two spherical atoms with diameter $\sigma_{
m d}$ and mass $m_{
m d}$

Massless spring modelled by a finite extensible non-linear elastic (fene) force between the beads *i* and *j* in the same dumbbell, $\mathbf{F}_{\text{fene}} = -\frac{k(r_i - r_j)}{1 - r_{ij}^2/r_0^2}$,

with an additional repulsive contribution (WCA) to avoid colloidal overlapping.

Polar active force along the main molecular axis $\mathbf{F}_{act} = F_{act} \hat{\mathbf{n}}$

Purely repulsive WCA interaction between colloids in different molecules.

Langevin modelling of the interaction with the embedding fluid:

isotropic viscous forces, $-\gamma \dot{r}_i$, and independent noises, η_i , on the beads.



Active dumbbells

Collective effects at intermediate ϕ

 $\phi=0.4$, Pe = 40, T=0.05

Bacteria colony

Phase segregation



A. Bright-field microscopy image of a motile bacteria-polymer mixtureB. Snapshot of simulation of active dumbbells with parameters chosen to be similar to the experiments shown in A.

Schwarz-Linek et al 12

Active dumbbells in $2d\,$

OLD phase diagram - motility induced phase transition



Mechanism for aggregation: note the head-tail alignment in the cluster.

Active dumbbells in 2d

OLD phase diagram - to be revised



Focus on the homogeneous phase. Start from the analysis of the passive limit

Plan

- 1. Active matter
- 2. Active Brownian dumbbells
- 3. Two-dimensional equilibrium phases

Passive limit: Beyond the BKT-Halperin-Nelson-Young scenario

4. Two-dimensional collective behaviour of active systems

No mobility induced phase transition (MIP)



BKTHNY *vs.* a new scenario by Bernard & Krauth

	BKTHNY	BK	
Solid	QLR pos & LR orient	QLR pos & LR orient	
transition	BKT (unbinding of dislocations)	BKT	
Hexatic phase	SR pos & QLR orient	SR pos & QLR orient	
transition	BKT (unbinding of disclinations)	1st order	
Liquid	SR pos & orient	SR pos & orient	

Basically, the phases are the same, but the low-lying transition is different, allowing for coexistence of the liquid and hexatic phases

Plan

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Results & questions

Brand new Bernard & Krauth two step transition scenario

Liquid	(1st order)	Hexatic	(BKTHNY)	Solid

confirmed for hard and soft passive disks

• Passive molecules?

- Active disks and molecules?
- Mobility induced phase transition for purely repulsive interactions vs.

an extension of the Bernard & Krauth passive system scenario

to the active dumbbell problem

LFC, di Gregorio, Gonnella & Suma 16

Phase diagram

Active dumbbells



T = 0.05

Coexistence region

& lines of constant proportion



Phase diagram (low T, as a function of packing fraction)



Phase diagram



Local maps of 1st column Local hexatic $|\psi_{6i}|$ 2nd column Local density ϕ_i

Phase diagram



Phase diagram



Spatial correlation between regions of high density and regions of large absolute value of the local hexatic order parameter

Local density & local hexatic parameter



Active dumbbell system

OLD phase diagram & new result



Connection between the two extremes!

Dynamics

 $|\psi_{6i}|$ at $\phi = 0.74$ and Pe = 10 (co-existence)

Phase diagram

Conclusions



T = 0.05

Discussion

Some things to do

• Confirm this picture for active hard and soft disks.

• Understand how to define a meaningful pressure.

- Investigate the dynamics taking into account the heterogeneity of the co-existence region.
 - Revisit the tracer motion under inhomogeneous conditions.
 - Revisit the effective temperature measurements.

Interaction potential

Lennard-Jones vs WCA

 ${\bf F}_{\rm pot}={\bf F}_{\rm wca}+{\bf F}_{\rm fene}$, $V=V_{\rm wca}+V_{\rm fene}~$ and hard repulsive $V_{\rm wca}$

$$V_{\text{wca}}(\boldsymbol{r}_{i}, \boldsymbol{r}_{j}) = \begin{cases} V_{LJ}(r_{ij}) - V_{LJ}(r_{c}) & r < r_{c} \\ 0 & r > r_{c} \end{cases}$$
$$V_{LJ}(r_{ij}) = 4\epsilon \left[\left(\frac{\sigma}{r_{ij}} \right)^{2n} - \left(\frac{\sigma}{r_{ij}} \right)^{n} \right] & r_{c} = 2^{1/n} \sigma = \sigma_{d} \end{cases}$$



LJ potential has repulsive and attractive branches WCA is purely repulsive

 ϵ and $\sigma_{\rm d}$ are the energy and length scales

Passive molecular systems

Solid, liquid and gas equilibrium phases



Typical (simple) density-temperature (ϕ, T) phase diagram

Lennard-Jones model system for Argon (more later) Kataoka & Yamada, J. Comp. Chem. Jpn. 11, 81 (2012)

Freezing transition

$\textbf{Solid} \mapsto \textbf{Liquid} \text{:} \textbf{Different routes in } 3d \text{ and } 2d$



Image from Pal, Kamal & Raghunathan, Sc. Rep. 6, 32313 (2016)

Crystals vs. solids

3d vs. 2d

• A crystal is a system with *long-range positional order*.

It has a periodic structure and its 'particles' are located close to the nodes of a lattice.

The position fluctuations are bounded.

- A solid is a material with *non-vanishing shear modulus*.
- 2d solids exist and have a weaker ordering than 3d crystals.
 - They are oriented crystals with quasi-long-range positional order.
 - Critical phase with algebraic relaxation of position correlations.
 - Phase transition à la Kosterlitz-Thouless (Nobel Prize 2016).

Equilibrium phases of 2d matter

Historical development

• Peierls (1934) & Mermin-Wagner (1966-68) results.

No positional long-range order in $2d\ {\rm at}$ finite T

 $\Delta^2(\mathbf{r}) = \langle [\mathbf{u}(\mathbf{r}) - \mathbf{u}(\mathbf{0})]^2 \rangle \simeq k_B T \ln r \quad \text{in} \quad d = 2$

Berenzinskii-Kosterlitz-Thouless-Halperin-Nelson-Young scenario
 Dislocations and disclinations

2d passive systems made of hard or soft disks in interaction
 Numerical simulations

Brand new Bernard & Krauth two step transition scenario
 Liquid to hexatic BKT transition preempted by a 1st order transition



Disks in two dimensions







Low density liquid

Which phase?

Crystalline triangular lattice

Note that in the crystal each disk has six neighbours

 $\phi_{\rm RCP} pprox 0.82$ (random close packing) $\phi_{\rm CP} pprox 0.91$ (close packing)

(Many) Figure(s) from E. Bernard, PhD Thesis, UPMC

Positional order

Disks, Voronoi cells & dislocations



A free dislocation (7-5) A bound pair of dislocations (twice 7-5)

In the crystal the centers of the disks form a triangular lattice (six neighbours) The **blue** disks have seven neighbours and the **red** ones have five. On the left image: the effect of the defect spreads over the full system.
Orientational order

Hexatic order





Associating arrows (directions) to disks

Orientational order

Hexatic order parameter





with N_{nn}^{i} the number of nearest (Voronoi) neighbours of bead i and θ_{ij} the angle between the segment that connects i with its neighbour j and the x axis.

For beads placed on the vertices of a triangular lattice, each bead has six nearest-neighbours, $j = 1, \ldots, 6$, the angles are $\theta_{ij} = 2\pi j/6$ and $\psi_{6i} = 1$ for all i.

measures orientational order

Orientational order

Disks, arrows and disclinations



The orientation winds by $\pm 2\pi$ around the **blue** (seven) and **red** (five) defects.

Very similar to the vortices in the 2d XY O(2) magnetic model.

BKTNHY scenario: the unbinding of vortices drives another BKT-like transition.

Correlation functions

Sketches (green seven & red five neighbours)



SolidHexaticLiquidDislocations & disclinations boundDislocations freeDisclinations free

Figure from Gasser, J. Phys. : Cond. Matt. 21, 203101 (2009)

Correlation functions

Positional



Correlation functions

Hexatic



Berezinskii-Kosterlitz-Thouless

Lack of universality of the transition in XY models

The RG proof yields, actually, an upper limit for the stability of the quasi long-range ordered phase.

A first order phase transition at a lower T can preempt the BKT one.

It does for sufficiently steep potentials:



"First order phase transition in an XY model with nn interactions"

Domany, Schick & Swendsen, Phys, Rev. Lett. 52, 1535 (1984)

Hexatic correlation function



Hexatic correlation function



Local density colour map



Co-existence between dense and loose regions

Active coarsening

at lower limit of coexistence



Co-existence region: independence of the initial conditions



Dynamics: Below, in and above the co-existence region



Discussion

Two populations in co-existence region



 ${\rm Pe}=10, \phi=0.78 {\rm ~at~} t=2500, \, 5000, \, 10000$

The averaged hexatic modulus is computed for each particle on a radius of 10 $\sigma_{\rm d}$ around the particle itself, and a particle is considered to be inside a cluster only if this value is greater than 0.75. Only such particles were taken into account in the red peak on the right.

In black : all dumbbells



Aim

Our interest is to describe the statics and dynamics of a classical (or quantum) system coupled to a classical (or quantum) environment.

The Hamiltonian of the ensemble is

$$H = H_{syst} + H_{env} + H_{int}$$



The dynamics of all variables are given by Newton (or Heisenberg) rules, depending on the variables being classical (or quantum).

The total energy is conserved, E = ct but each contribution is not, in particular, $E_{syst} \neq \text{ct}$, and we'll take $e_0 \ll E_{syst} \ll E_{env}$.

Dynamics in equilibrium

Conditions

Take an open system coupled to an environment

Environment		
Interact System	ion	

Necessary :

— The bath should be in equilibrium

same origin of noise and friction.

— Deterministic force :

conservative forces only, $\vec{F} = -\vec{\nabla}V$.

— Either the initial condition is taken from the equilibrium pdf, or the latter should be reached after an equilibration time t_{eq} :

$$P_{eq}(v,x) \propto e^{-\beta(\frac{mv^2}{2}+V)}$$

Microscopic scales



Image taken from Bechinger et al, Rev. Mod. Phys. 88, 045006 (2016)

Models & Methods

From very detailed to approximate

	Biological	Statistical physics	Non-linear dynamics
Microscopic		Brownian/Run&Tumble	Cellular automata
Collective		Phases & transitions	Bifurcations
Experiments		Soft-condensed matter	
Numerical		MD, MC, Lattice Boltzmann	Integration
Analytical		Liquid/Glass theory	Hydrodyn/Mechanics

Vicsek model

Minimal (cellular automata) model for flocking

Flocking due to any kind of self-propulsion and alignment with neighbours.

The position and velocity of an agent are r_i and $v_i = v_0 \hat{v}_i$ with $v_0 = \text{cst}$.

Each microscopic update is such that the individual's direction is updated according to the mean ... over its neighbours

$$\hat{\boldsymbol{v}}_i(t+\delta t) = \overline{\hat{\boldsymbol{v}}_j(t)}_{|\boldsymbol{r}_i-\boldsymbol{r}_j|< r} + \boldsymbol{\eta}_i(t)$$

plus some noise η_i (normalisation is imposed after each step) and moves at constant speed v_0 in the new direction

$$\boldsymbol{r}_i(t+\delta t) = \boldsymbol{r}_i(t) + v_0 \hat{\boldsymbol{v}}_i(t+\delta t) \,\delta t$$

"Novel Type of Phase Transition in a System of Self-Driven Particles", Vicsek, Czirók, Ben-Jacob, Cohen, Shochet, Phys. Rev. Lett. 75 1226 (1995)

Vicsek model

Minimal (cellular automata) model for flocking

Flocking due to any kind of self-propulsion and alignment with neighbours.

The particles are self-propelled due to v_0

The total number of particles is conserved (no birth/death).

The velocity direction plays a similar role to the one of the spin in the Heisenberg (or XY) ferromagnetic models (more later)

As the particles move in the direction of their velocity, the "connectivity matrix" is not constant, but evolves (if the interaction range is finite).

There is no momentum conservation and Galilean invariance is broken.

Spontaneous symmetry breaking of polar order, $m{p}(t) = rac{1}{N} \sum_{i=1}^N \hat{m{v}}_i(t)
eq 0$

At $v_0 = 0$ the model is the Heisenberg one. However, this is a singular limit.



Minimal (cellular automata) model for flocking

Flocking due to any kind of self-propulsion and alignment with neighbours.

The global behaviour is controlled by the density ϕ , the noise amplitude $k_B T$ and the particles' modulus of the velocity v_0 .

Dynamic phase diagram (k_BT, ϕ) (v_0 fixed) from

the polar order parameter $m{p}(t) = rac{1}{N} \sum_{i=1}^N \hat{m{v}}_i(t)$

- Homogenous collective motion (high density, weak noise)
- Ordered bands (intermediate)
- Disordered (low density, strong noise)

"Novel Type of Phase Transition in a System of Self-Driven Particles", Vicsek, Czirók, Ben-Jacob, Cohen, Shochet, Phys. Rev. Lett. 75 1226 (1995) Ginelli, arXiv:1511.01451 in Microswimmers Summer School, Jülich

Continuum model

The mean center-of-mass velocity $\langle \boldsymbol{v} \rangle$ is the order parameter.

The development of $\langle \boldsymbol{v} \rangle \neq \boldsymbol{0}$ for the flock as a whole requires spontaneous breaking of the continuous rotational symmetry.

Out of equilibrium feature possible also in low dimensions.

Breakdown of linearized hydrodynamics imply large fluctuations in dimensions smaller than four.

Argument: Improved transport suppresses the very fluctuations that give rise to it, leading to long-range order in d = 2.

"Flocks, herds, and schools : A quantitative theory of flocking", **Toner & Tu, Phys. Rev. E 58, 4828 (1998)**

Continuum model : giant density fluctuations





"Long-Range Order in a 2d Dynamical XY Model : How Birds Fly Together" "Flocks, herds, and schools : A quantitative theory of flocking", J. Toner & Y. Tu, Phys. Rev. Lett. 75, 4326 (1995), Phys. Rev. E 58, 4828 (1998)

Continuum model



 $\alpha_1 < 0 \; (\alpha_1 > 0)$ in the homogenous (flocking) phase

"Hydrodynamic eqs. for self-propelled part.: microscopic derivation & stability analysis" Bertin, Droz and Grégoire, J. Phys. A 42, 445001 (2009)

Run & tumble particles

This mechanism can be described as a repeating sequence of two actions:

- (i) a period of nearly constant-velocity translation (run) followed by
- (ii) a seemingly erratic rotation (tumble).

Observed by Berg & Brown, Nature (1972)

Simulation

from M. Kardar's webpage

Run with $v = 20 \, \mu m/s$; tumble with rate $\alpha = 1/s$ and duration $\tau = 0.1 \, s$

Diffusion constants

$$D_{RT} = \frac{v^2}{d\alpha(1+\alpha\tau)} \simeq 100 \,\mu m^2/s$$
$$D_{BM} = \frac{k_B T}{6\pi\eta R} \simeq 0.2 \,\mu m^2/s$$

Run & tumble particles

Some trajectories depending on the environment



Trajectories of E. coli cells in (A) buffer and (B) polymeric solution

"Running and tumbling with E. coli in polymeric solutions", Patteson, Gopinath, Goulian and Arratia, Scient. Rep. 5, 15761 (2015)

Fluctuating hydrodynamic theories in low density limits

Local density scalar field $\rho(\mathbf{r},t) = \sum_{i=1}^{N} \delta(\mathbf{r} - \mathbf{r}_{i}(t))$

Local polar vector field $\boldsymbol{p}(\boldsymbol{r},t) = \frac{1}{\rho(\boldsymbol{r},t)} \sum_{i=1}^{N} \hat{\boldsymbol{v}}_{i}(t) \delta(\boldsymbol{r}-\boldsymbol{r}_{i}(t))$

$$\partial_t \rho + v_0 \nabla \cdot (\rho \mathbf{p}) = -\nabla \cdot \left(-\frac{1}{\gamma_{\rho}} \nabla \frac{\delta F}{\delta \rho} + \eta_{\rho} \right)$$
$$\partial_t \mathbf{p} + \lambda_1 (\mathbf{p} \cdot \nabla) \mathbf{p} = -\frac{1}{\gamma_{p}} \frac{\delta F}{\delta \mathbf{p}} + \eta_{p}$$

with wise proposals for the "free-energy" F and noises η_{ρ} and η_{p} .

"Hydrodynamics of soft active matter"

Marchetti, Joanny, Ramaswamy, Liverpool, Prost, Rao, Simha Rev. Mod. Phys. 85 (2013)

Langevin approach

Lennard-Jones potential



Langevin approach

Lennard-Jones potential



Langevin approach

Lennard-Jones potential





First order route: nucleation & growth



Nucleation barrier $\Delta F(R)$

Examples of two crystalline configurations

$$\Delta F(R) \equiv F_{\text{bubble}}(R) - F_{\text{no bubble}}(R) \approx -\delta f R^d + s R^{d-1}$$

$$\Delta F(R_c) \approx \frac{s^d}{(\delta f)^{d-1}} \quad \text{ and } \quad R_c \approx \frac{s}{\delta f} \quad \text{ in } d \geq 2$$

Left image from Gasser, J. Phys. : Cond. Matt. 21, 203101 (2009)



First order route: nucleation & growth



Crossing point $\Delta F(R^*) = 0$

Examples of two crystalline configurations

 $\Delta F(R) \equiv F_{\text{bubble}}(R) - F_{\text{no bubble}}(R) \approx -\delta f R^d + s R^{d-1}$

$$0 = \Delta F(R^*) \approx -\delta f R^{*d} + s R^{*d-1} \quad \Rightarrow \quad \left| R^* \approx \frac{s}{\delta f} \right|$$

Left image from Gasser, J. Phys. : Cond. Matt. 21, 203101 (2009)

Berezinskii-Kosterlitz-Thouless

The $2d\ {\rm XY}$ model

At very high temperature one expects disorder.

At very low temperature the harmonic approximation is exact and there is quasi long-range order.

There must be a transition in between.

Assumption: the transition is continuous and it is determined by the unbinding of vortices (topological defects).

Proved with RG, assuming a continuous phase transition.

The correlation length diverges exponentially $\xi_{eq} \simeq e^{a/|T-T_{BKT}|^{-\nu}}$ at T_{BKT} and it remains infinite in the phase with quasi long-range order.

2d XY model

Vortices

2d XY model

BKT transition



$T < T_{\rm BKT}$

$T > T_{\rm BKT}$

A few paired vortices

Vortices are all over and unbound

A small portion of a much larger system with periodic boundary conditions is shown.

Images copied from S. Burton's site

Equilibrium phases

Macroscopic properties

- A gas is an an air-like fluid substance which expands freely to fill any space available, irrespective of its quantity.
- A liquid is a substance that flows freely but is of constant volume, having a consistency like that of water or oil. It takes the shape of its container
- A solid is a material with non-vanishing shear modulus.
- A crystal is a system with long-range positional order.

It has a periodic structure and its 'particles' are located close to the nodes of a lattice.
Mermin-Wagner theorem

Consequences

A continuous symmetry cannot be spontaneously broken in 2d.

(The Hamiltonian $\frac{K}{2} \int d^d r \; [\nabla u(\mathbf{r})]^2$ is invariant under global rotations of \mathbf{u})

Corollary: a crystal with long-range order cannot exist at T > 0 in d = 2.

Reason: in low d fluctuations are more effective and inhibit order.

Quasi long-range positional order with algebraically decaying correlations is possible, $C(r) \simeq r^{-\eta}$.

Note the similarity with the 2d XY model of magnetism, $s_i = (\cos \theta_i, \sin \theta_i)$

$$-\frac{H}{J} = \sum_{\langle ij \rangle} \boldsymbol{s}_i \cdot \boldsymbol{s}_j = \sum_{\langle ij \rangle} \cos \theta_{ij} \simeq \sum_{\langle ij \rangle} (1 - \frac{\theta_{ij}^2}{2}) \approx -\frac{1}{2} \int d^2 r \; [\boldsymbol{\nabla} \theta(\boldsymbol{r})]^2$$

Voronoi tessellation

A Voronoi diagram is induced by a set of points, called sites, that in our case are the centres of the disks.

The plane is subdivided into faces that correspond to the regions where one site is closest.



Focus on the central light-green face All points within this region are closer to the dot within it than to any other dot on the plane The region has five neighbouring cells from which it is separated by an edge The grey zone has six neighbouring cells

Close packing of disks

Disks, Voronoi cells & dislocations



A free dislocation

A bound pair of dislocations

In the crystal the centers of the disks form a triangular lattice

The **blue** disks have seven neighbours and the **red** ones have five.

On the right image: the external path closes and forms a perfect hexagon. The effects of the defects are confined.

Correlation between the local orientation and density



"Two-step melting in two dimensions : first-order liquid-hexatic transition"

Bernard & Krauth, Phys. Rev. Lett. 107, 155704 (2011)

Time evolution from different initial states in the co-existence region



Initial state solid in **a**, liquid in **b**.

Red lines obtained w/simple MC, other w/smart algorithm

"Two-step melting in two dimensions : first-order liquid-hexatic transition"

Bernard & Krauth, Phys. Rev. Lett. 107, 155704 (2011)

$\label{eq:pressure_loop} \mbox{Pressure_loop} \mbox{ and finite } N \mbox{ dependence} \\$



Similar to Van der Waals model for 1st order phase transitions

P cannot increase with V (stability): phase separation via Maxwell construction

Pressure loop and finite N dependence



A system with PBCs has a \sim flat interface with surface energy scaling as $S\simeq L^{d-1}=\sqrt{N}$ and $f\simeq N^{-1/2}$. Verified in the inset for $\phi\simeq 0.708$

Local density

For each bead, *i* the first estimate of the local density ϕ_i^{Vor} is the ratio between its surface and the area A_i^{Vor} of its Voronoi region:

$$\phi_i^{\rm Vor} = \frac{\pi \sigma_{\rm d}^2}{4A_i^{\rm Vor}}$$

We next coarse-grain this value by averaging the single-bead densities ϕ_i^{Vor} over a disk $S_R^{(i)}$ with radius R

$$[[\phi_i]] \equiv \sum_{i \in S_R^{(i)}} \phi_i^{\text{Vor}} / (\pi R^2)$$

Visualisation: each bead is painted with the colour of its coarse-grained local density value, $[[\phi_i]]$, denser in red, looser in blue.



Voronoi tessellation

A Voronoi diagram is induced by a set of points, called sites, that in our case are the centres of the dumbbell beads.

The plane is subdivided into faces that correspond to the regions where one site is closest.



Focus on the central light-green face All points within this region are closer to the dot within it than to any other dot on the plane The region has five neighbouring cells from which it is separated by an edge The grey zone has six neighbouring cells



Voronoi tessellation

A Voronoi diagram is induced by a set of points, called sites, that in our case are the centres of the dumbbell beads.

The plane is subdivided into faces that correspond to the regions where one site is closest.



With dashed lines, the triangular lattice The vertices are the sites Each site has six nearest neighbours The angles of the edges of the triangular lattice are $\theta_{ij}=2\pi j/6$

The hexagonal lattice is the Voronoi tessellation

Local density

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Initial conditions

Three cases



Crystal

Hexatic order

Random

with the desired ϕ

Positional order

The (fluctuating) local particle number density

$$ho(oldsymbol{r}_0) = \sum_{i=1}^N \, \, \delta(oldsymbol{r}_0 - oldsymbol{r}_i)$$

with normalisation $\int d^d r_0 \, \rho(r_0) = N$. In a homogeneous system $ho(r_0) = N/V$.

The density-density correlation function $C(\mathbf{r} + \mathbf{r}_0, \mathbf{r}_0) = \langle \rho(\mathbf{r} + \mathbf{r}_0) \rho(\mathbf{r}_0) \rangle$ that, for homogeneous (independence of \mathbf{r}_0) and isotropic ($\mathbf{r} \mapsto |\mathbf{r}| = r$) cases, is simply $C(\mathbf{r} + \mathbf{r}_0, \mathbf{r}_0) = C(r)$.

The double sum in $C(\mathbf{r} + \mathbf{r}_0, \mathbf{r}_0) = \langle \sum_{ij} \delta(\mathbf{r} + \mathbf{r}_0 - \mathbf{r}_i) \delta(\mathbf{r}_0 - \mathbf{r}_j) \rangle$ has contributions from i = j and $i \neq j : C_{\text{equal}} + C_{\text{diff}}$

Positional order

The density-density correlation function

 $C(\mathbf{r} + \mathbf{r}_0, \mathbf{r}_0) = \langle \rho(\mathbf{r} + \mathbf{r}_0) \rho(\mathbf{r}_0) \rangle = \sum_{ij} \langle \delta(\mathbf{r} + \mathbf{r}_0 - \mathbf{r}_i) \delta(\mathbf{r}_0 - \mathbf{r}_j) \rangle$

is linked to the structure factor

$$S(\boldsymbol{q}) \equiv \frac{1}{N} \langle \tilde{\rho}(\boldsymbol{q}) \tilde{\rho}(-\boldsymbol{q}) \rangle = \frac{1}{N} \langle \sum_{i=1}^{N} \sum_{j=1}^{N} e^{-i\boldsymbol{q} \cdot (\boldsymbol{r}_{i} - \boldsymbol{r}_{j})} \rangle$$

by

$$NS(\boldsymbol{q}) = \int d^d \boldsymbol{r}_1 \int d^d \boldsymbol{r}_2 \ C(\boldsymbol{r}_1, \boldsymbol{r}_2) \ e^{-i\boldsymbol{q}\cdot(\boldsymbol{r}_1 - \boldsymbol{r}_2)}$$

Positional order

In isotropic cases, i.e. liquid phases, the pair correlation function

 $rac{N}{V} g(r) =$ average number of particles at distance r from a tagged particle at r_0



is linked to the structure factor

$$S(\boldsymbol{q}) = \frac{1}{N} \langle \sum_{i=1}^{N} \sum_{j=1}^{N} e^{-i\boldsymbol{q}\cdot(\boldsymbol{r}_i - \boldsymbol{r}_j)} \rangle$$

by

$$S(\boldsymbol{q}) = 1 + \frac{N}{V} \int d^d \boldsymbol{r} \ g(r) \ e^{\mathrm{i} \boldsymbol{q} \cdot \boldsymbol{r}}$$

Peaks in g(r) are related to peaks in S(q). The first peak in S(q) is at $q_0 = 2\pi/\Delta r$ where Δr is the distance between peaks in g(r) (that is close to the inter particle distance as well).

Liquid



"Introduction to Modern Statistical Mechanics", Chandler (OUP)



Experiments & simulations of liquids



Inter-peak distance in g(r) is $\Delta r \simeq \sigma \simeq 3$ Å

Position of the first peak in S(q) is at $q_0\simeq 2\pi/\Delta r\simeq 2$ Å $^{-1}$

"Structure Factor and Radial Distribution Function for Liquid Argon at 85K",

Yarnell, Katz, Wenzel & König, Phys. Rev. Lett. 7, 2130 (1973)

Structure factor for crystals

 r_i and r_j are the positions of the beads i and j and q is the wave-vector :

$$S(\boldsymbol{q}) = \frac{1}{N} \sum_{ij} \langle e^{i\boldsymbol{q} \cdot (\boldsymbol{r}_i - \boldsymbol{r}_j)} \rangle$$

Visualisation: 2d representation in the (q_x, q_y) plane, Bragg peaks.



Triangular lattice in real space

Hexagonal lattice in reciprocal space

Voronoi cell

Brillouin zone

Hexatic order



with N_{nn}^{i} the number of nearest (Voronoi) neighbours of bead i and θ_{ij} the angle between the segment that connects i with its neighbour j and the x axis.

For beads placed on the vertices of a triangular lattice, each bead has six nearest-neighbours, $j = 1, \ldots, 6$, the angles are $\theta_{ij} = 2\pi j/6$ and $\psi_{6i} = 1$ for all i.

measures orientational order

Hexatic order

The local hexatic fluctuating order

$$\psi_{6i} = \frac{1}{N_{\rm nn}^i} \sum_{j=1}^{N_{\rm nn}^i} e^{6i\theta_{ij}}$$

We also look at the average of the modulus and modulus of the average

$$2N\,\psi_6 = \left|\sum_{i=1}^N \psi_{6i}\right| \qquad 2N\,\Gamma_6 = \sum_{i=1}^N |\psi_{6i}|$$

and the correlation functions

$$g_{6}(r) = \frac{\sum_{ij} [\langle \psi_{6i}^{*} \psi_{6j} \rangle] \Big|_{r_{ij}=r}}{[\langle |\psi_{6i}|^{2} \rangle]}$$

Note that the normalisation is site independent

Passive system

Structure factor - very low and very high density



$$\phi = 0.76$$



Liquid

Solid

Bragg peaks

Primitive vectors

$$q_1 = \frac{4\pi}{a\sqrt{3}} \left(\frac{\sqrt{3}}{2}, -\frac{1}{2}\right)$$
$$q_2 = \frac{4\pi}{a\sqrt{3}} (0, 1)$$
Unit of length
$$a = \left(\frac{\pi}{2\sqrt{3}\phi}\right)^{1/2} \sigma_d$$

Passive system

Structure factor - progressive increase in density



Passive system

Hexatic order parameter



Dumbells

Hexatic local vector

Plan

- 1. The result: new phase diagram
- 2. The interacting dumbbells model
- 3. Passive case
- 4. Active case
- 5. Discussion of

Mobility induced phase transition for purely repulsive interactions *vs.*

just an extension of the Bernard & Krauth passive system scenario

Hexatic order

The local hexatic fluctuating order

$$\psi_{6i} = \frac{1}{N_{\rm nn}^i} \sum_{j=1}^{N_{\rm nn}^i} e^{6i\theta_{ij}}$$

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$$g_{6}(r) = \frac{\sum_{ij} [\langle \psi_{6i}^{*} \psi_{6j} \rangle] \Big|_{r_{ij}=r}}{[\langle |\psi_{6i}|^{2} \rangle]}$$

Note that the normalisation is site independent

Single active dumbbell

Control parameters

Number of dumbbells N = 1 and box volume S in two dimensions:

Transport rates: Advective transport $Lv \mapsto \sigma_d F_{act}/\gamma$ Péclet number diffusive transport $D \mapsto k_B T/(2\gamma)$ Péclet number Active force $Lv \mapsto \sigma_d F_{act}/\gamma$ viscous force $\nu \mapsto \gamma \sigma_d^2/m_d$ Reynolds number $Pe \in [0, 40]$ $Re < 10^{-2}$

We keep the parameters in the harmonic (fene) and WCA (repulsive) potential fixed. Stiff molecule limit: vibrations frozen.

Interest in the \mbox{Pe} (and later $\phi)$ dependencies.

Orientation vector construction



Figure 3.4: Close view of the construction for the visualization of the orientational field. a: Hard disks b: Voronoi construction, the arrows represent the local orientations. c: Coloration of the orientation depending on their projection toward a given axis. d: The Voronoi cells are colored. (Ref [6], cf. Section 7.3).

"Two-step melting in two dimensions : first-order liquid-hexatic transition"

Bernard & Krauth, Phys. Rev. Lett. 107, 155704 (2011)

Coexistence



"Two-step melting in two dimensions : first-order liquid-hexatic transition"

Bernard & Krauth, Phys. Rev. Lett. 107, 155704 (2011)



Equilibrium phases of $2d\ \mathrm{matter}$

• 2d passive systems made of hard or soft disks in interaction

	BKTHNY	BeKr
Solid	QLR pos & LR orient	QLR pos & LR orient
transition	BKT (unbinding of dislocations)	BKT
Hexatic phase	SR pos & QLR orient	SR pos & QLR orient
transition	BKT (unbinding of disclinations)	1st order
Liquid	SR pos & orient	SR pos & orient

Active dumbbell system

Mechanism for segregation



Active dumbbell system

Structure factor Pe = 10 & Pe = 40



Harmonic solids

Peierls calculation

Consider a crystal made of atoms connected to their nearest-neighbours (nn) by Hooke springs.

Call ϕ_{R_i} the position of the *i*th atom that, at zero temperature, is located at a vertex R_i of a regular lattice, the equilibrium positions of the springs.

At finite temperature the atomic positions fluctuate, $\phi_{R_i} = R_i + u_{R_i}$, with u_{R_i} the local displacement from R_i .

 $1d \operatorname{sketch}$



Does the long-range positional order survive at finite T in 2d?

Harmonic solids

Peierls calculation

Consider a crystal made of atoms connected to their nearest-neighbours (nn) by Hooke springs.

Call $\phi_{\mathbf{R}_i}$ the position of the *i*th atom that, at zero temperature, is located at a vertex \mathbf{R}_i of a regular lattice, the equilibrium positions of the springs.

At finite temperature the atomic positions fluctuate, $\phi_{R_i} = R_i + u_{R_i}$, with u_{R_i} the local displacement from R_i .



BKT-Halperin-Nelson-Young

The $2d\ {\rm particle}\ {\rm systems}$

At very high temperature (low density) one expects disorder.

At very low temperature (high density) the harmonic approximation is exact and there is quasi long-range order.

There must be a transition in between.

Assumption: the transition is continuous and it is determined by the unbinding of dislocations in the solid (topological defects).

Proved with RG that assumes a continuous phase transition.

The correlation length diverges exponentially $\xi_{eq} \simeq e^{a/|T-T_c|^{-\nu}}$ at T_c and it remains infinite in the phase with quasi long-range order.

Active dumbbell system

Active mechanism for segregation





Activity favours segregation