

# Collective behaviours: from the Ising model to bird flocks

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# Definition of collective behaviours



# Why do biological systems behave collectively?

Mainly to **efficiently respond to external stimuli**, propagating information in a very efficient way.

For example:

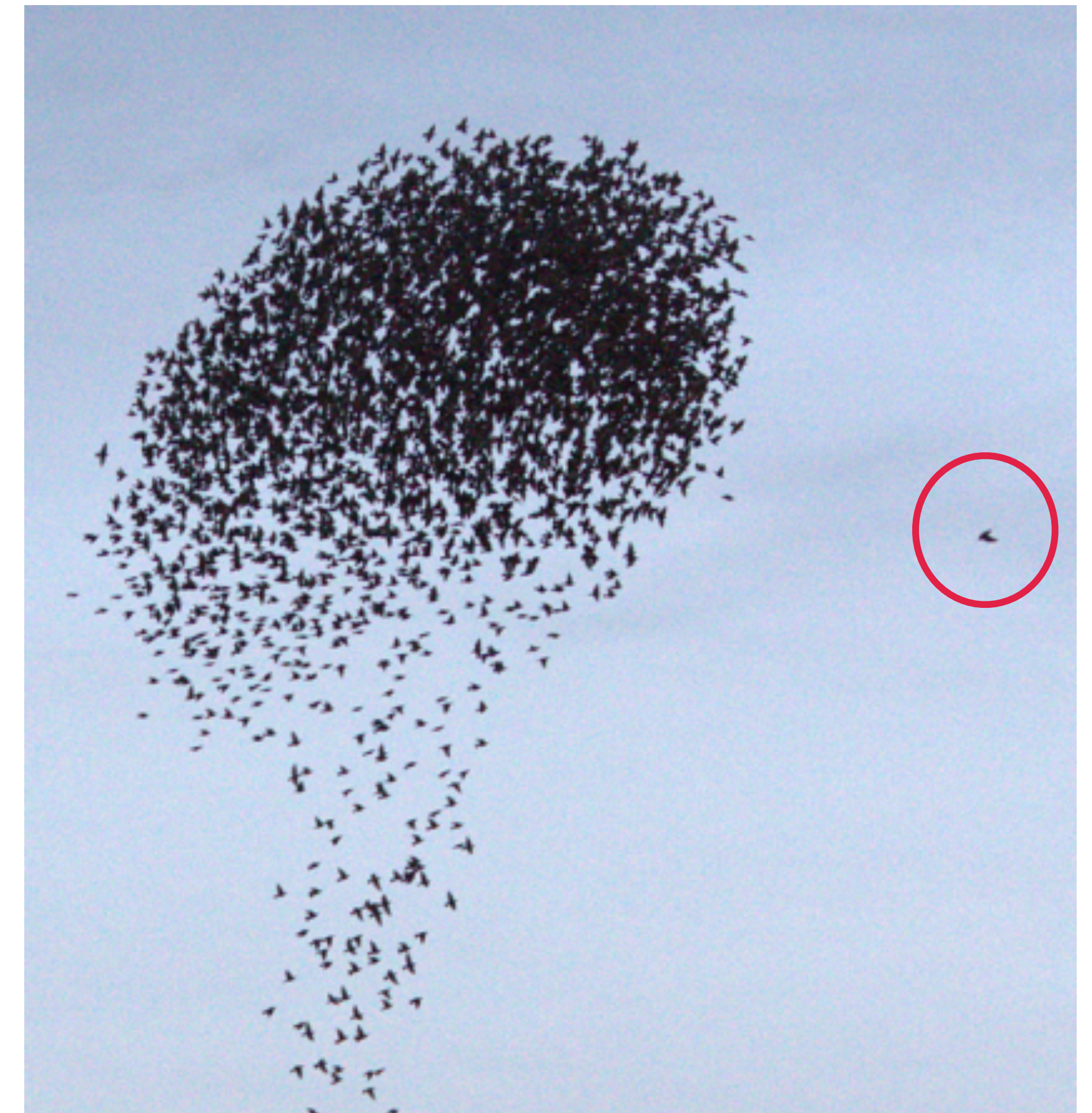
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We can say that a **system behaves collectively**:

- when it **collectively responds to external stimuli**;
- when the **collective modes are “easy” to excite**;
- when the system is **strongly correlated**.

# Collective behaviours in the Ising Model

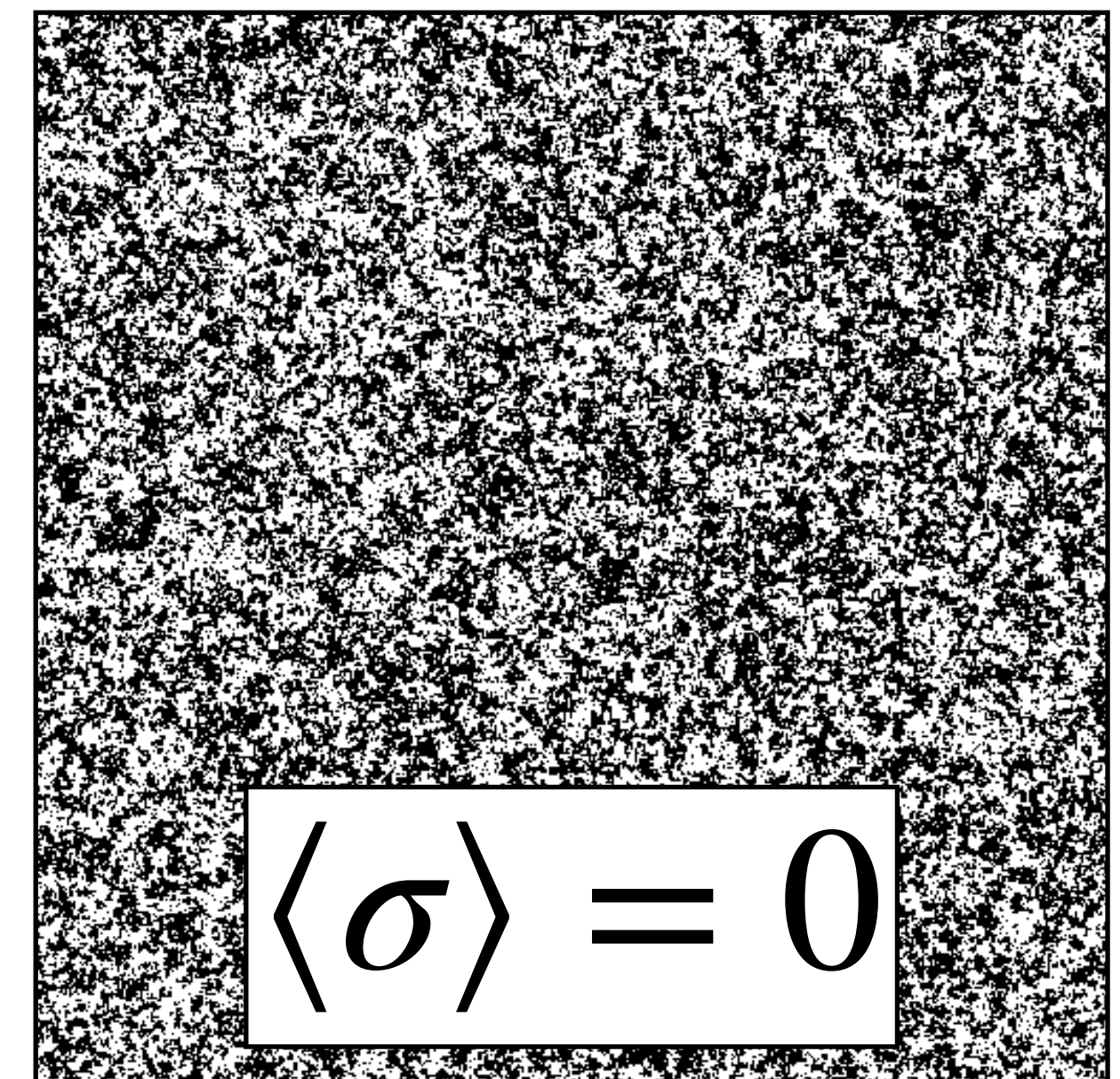
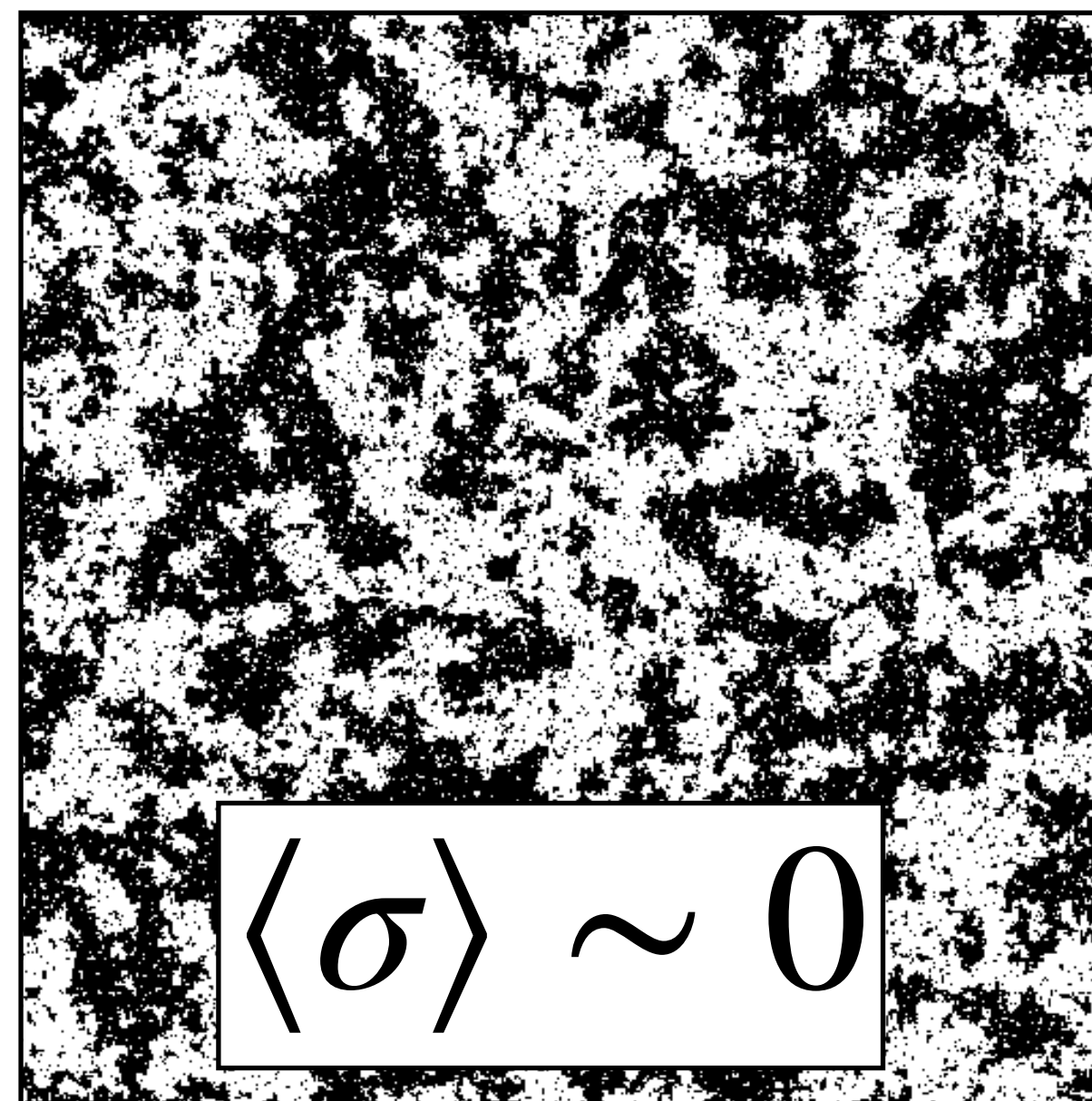
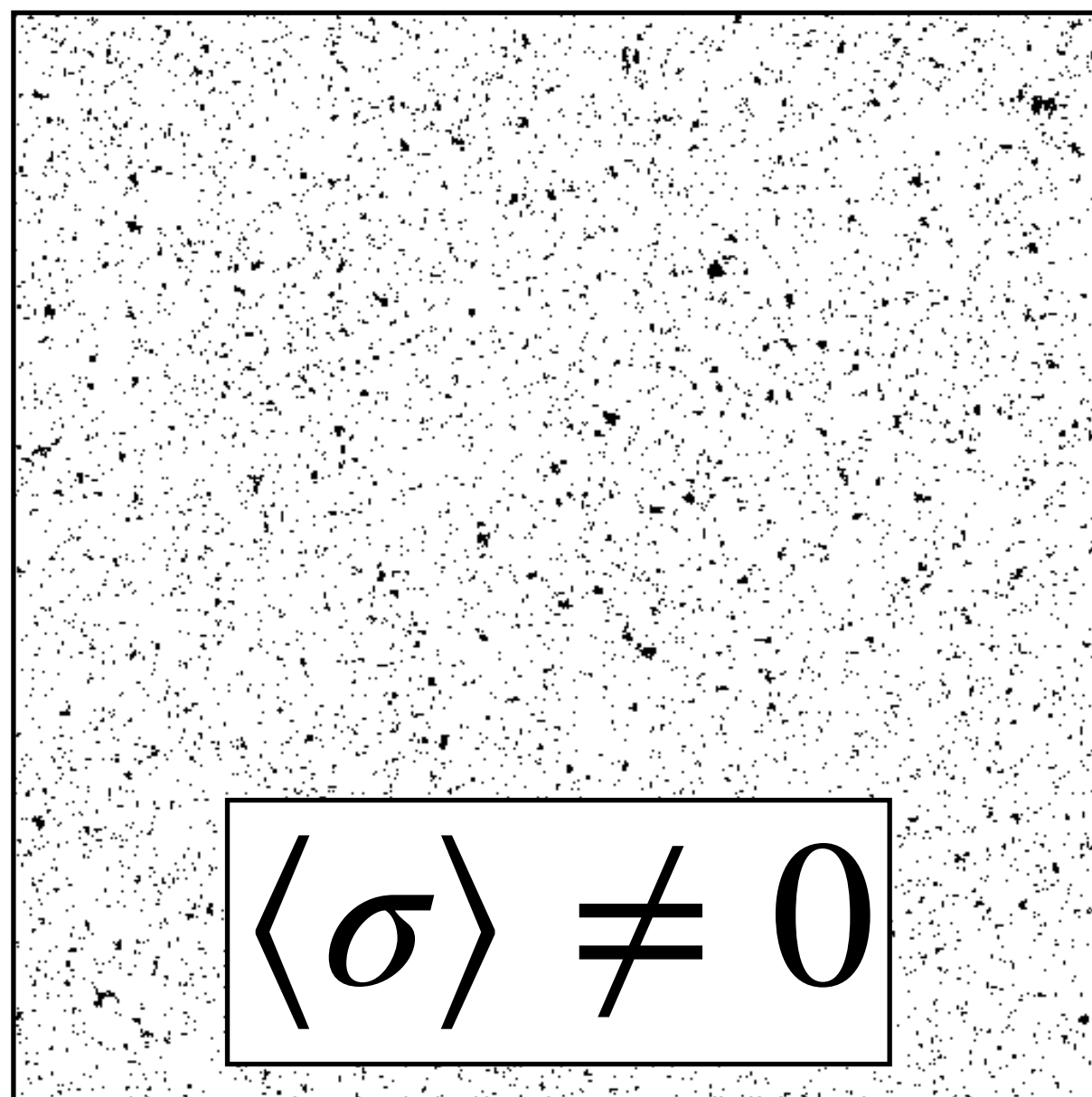
The Ising Model:

$$H(\vec{\sigma}) = - \sum J_{ij} \sigma_i \sigma_j \quad \rightarrow \quad P(\vec{\sigma}) \propto e^{-\beta H(\vec{\sigma})}, \quad \beta = T^{-1}$$

$$T \ll T_c$$

$$T \sim T_c$$

$$T \gg T_c$$



# Collective behaviours in the Ising Model

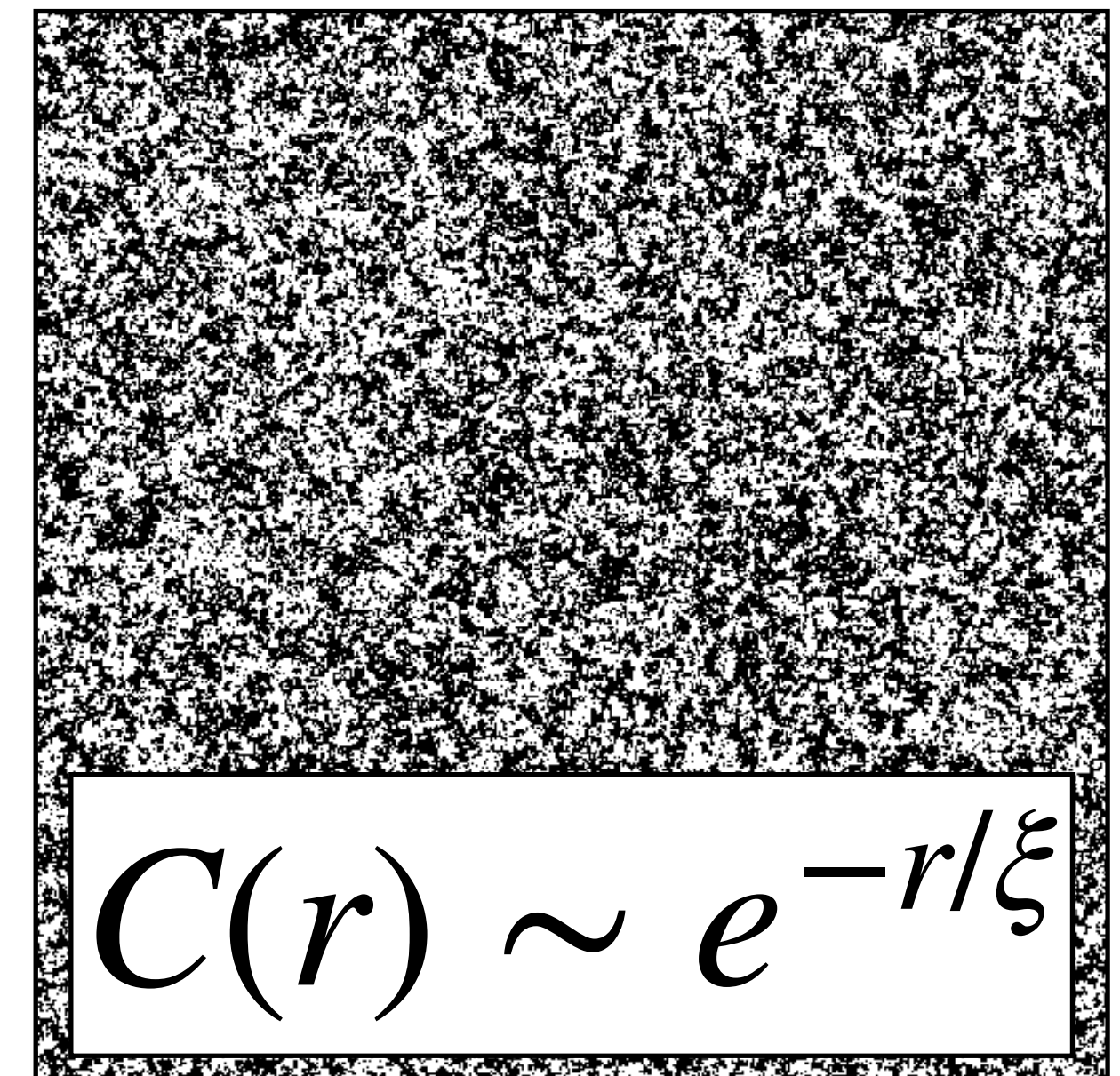
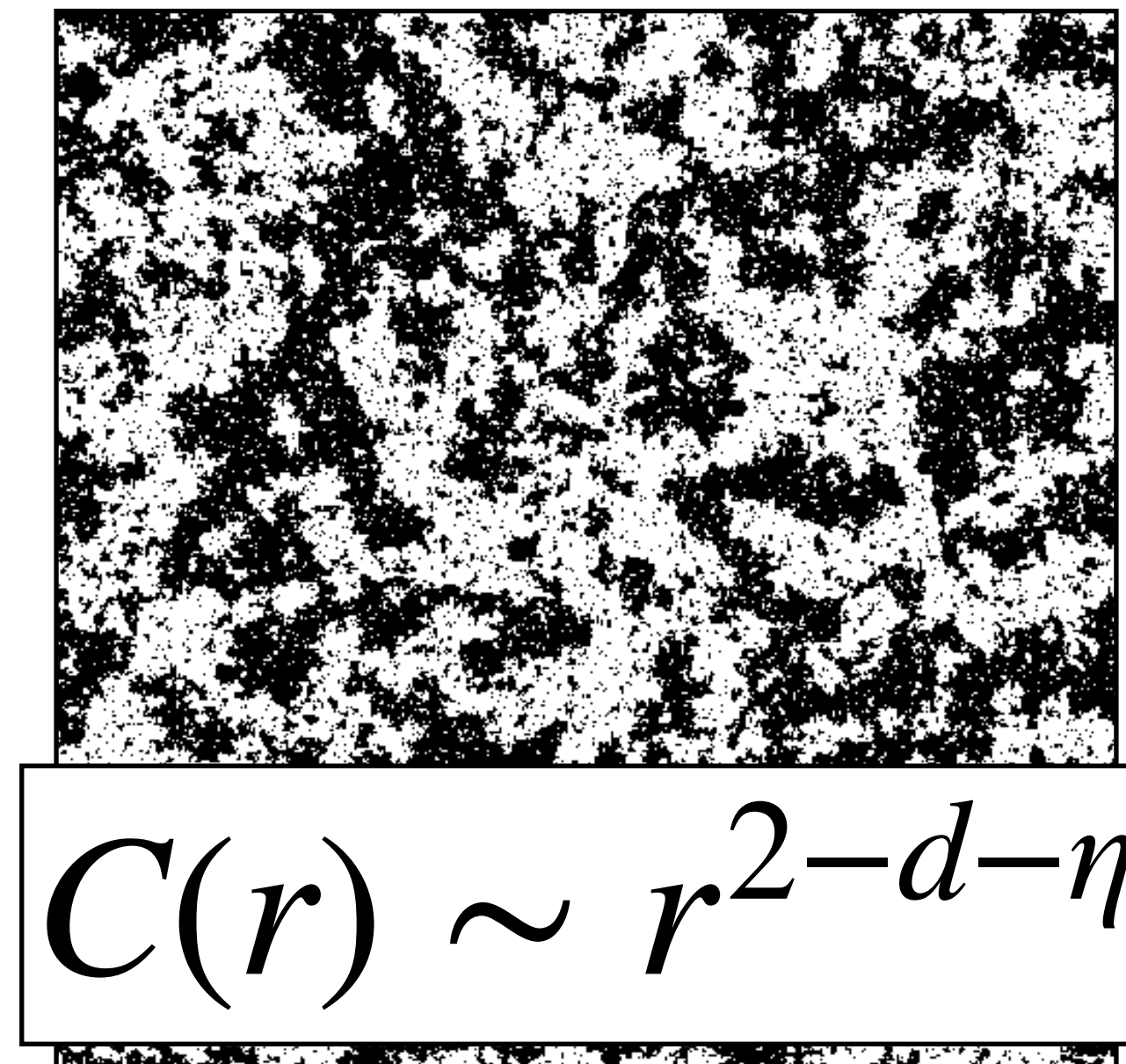
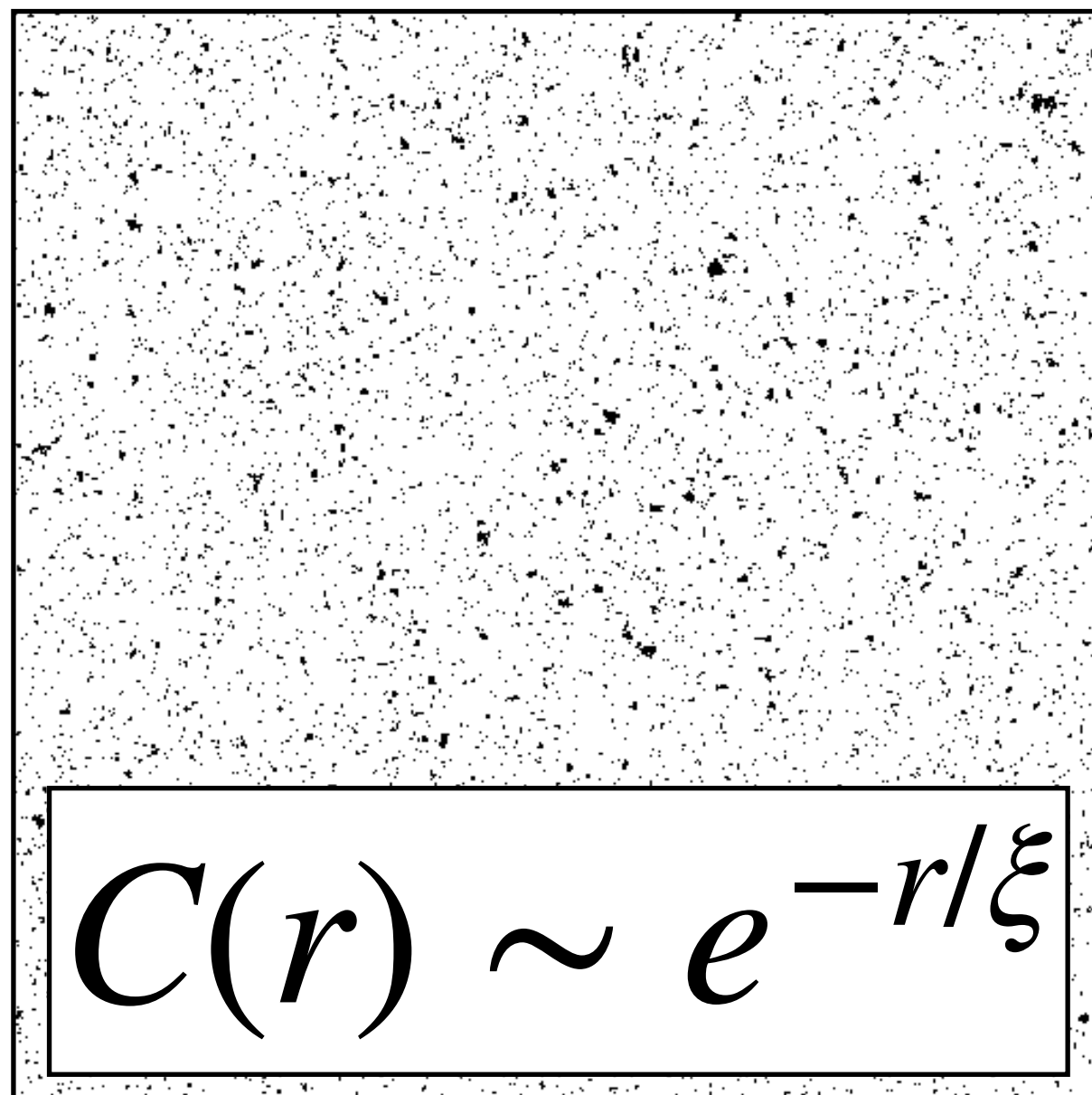
Correlation functions as a way to probe collective behaviours:

$$C(r) = \sum_{i,j} \delta\sigma_i \delta\sigma_j \delta\left(r - \left|R_i - R_j\right|\right) \quad \delta\sigma_i = \sigma_i - \langle\sigma\rangle$$

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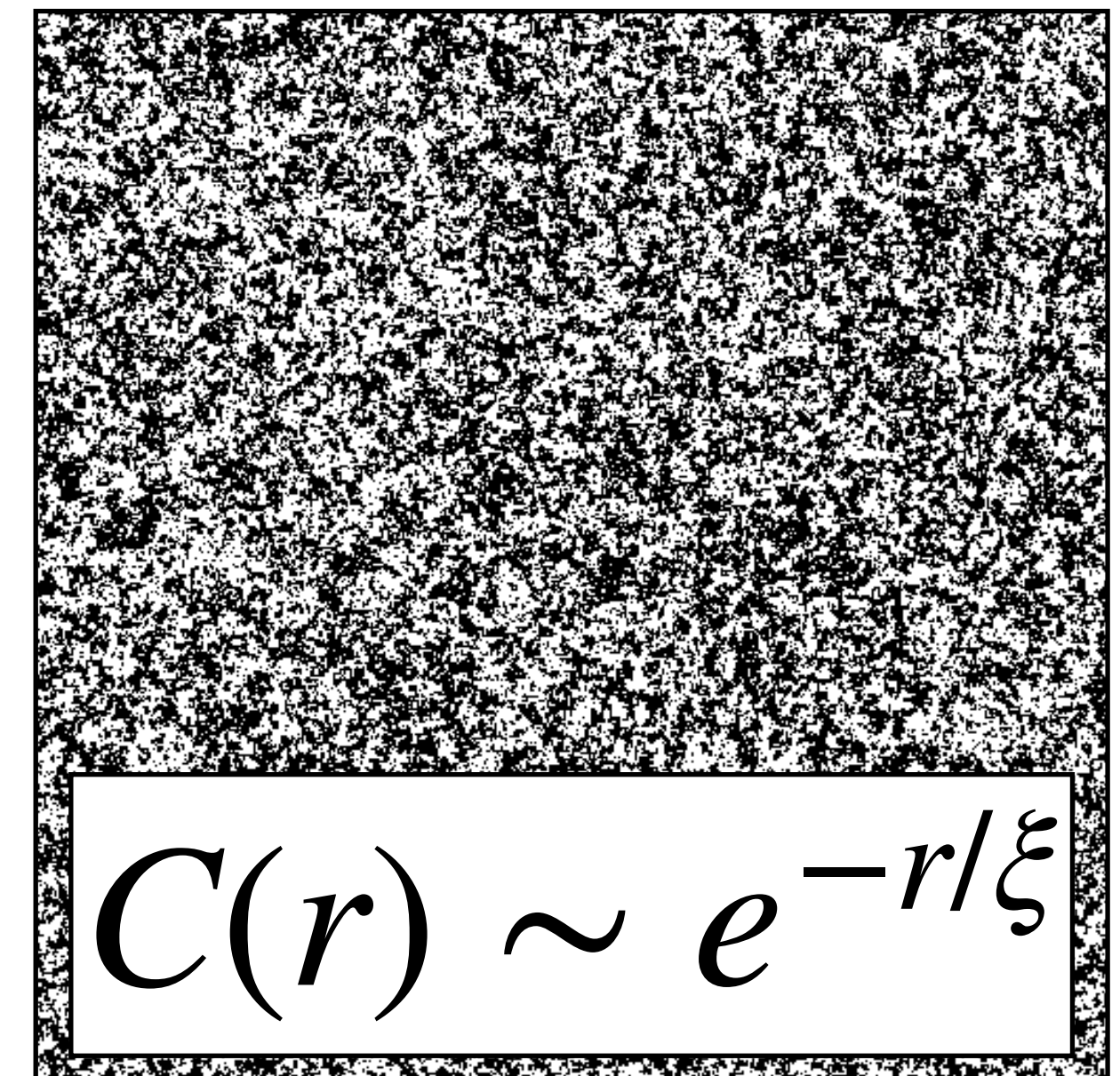
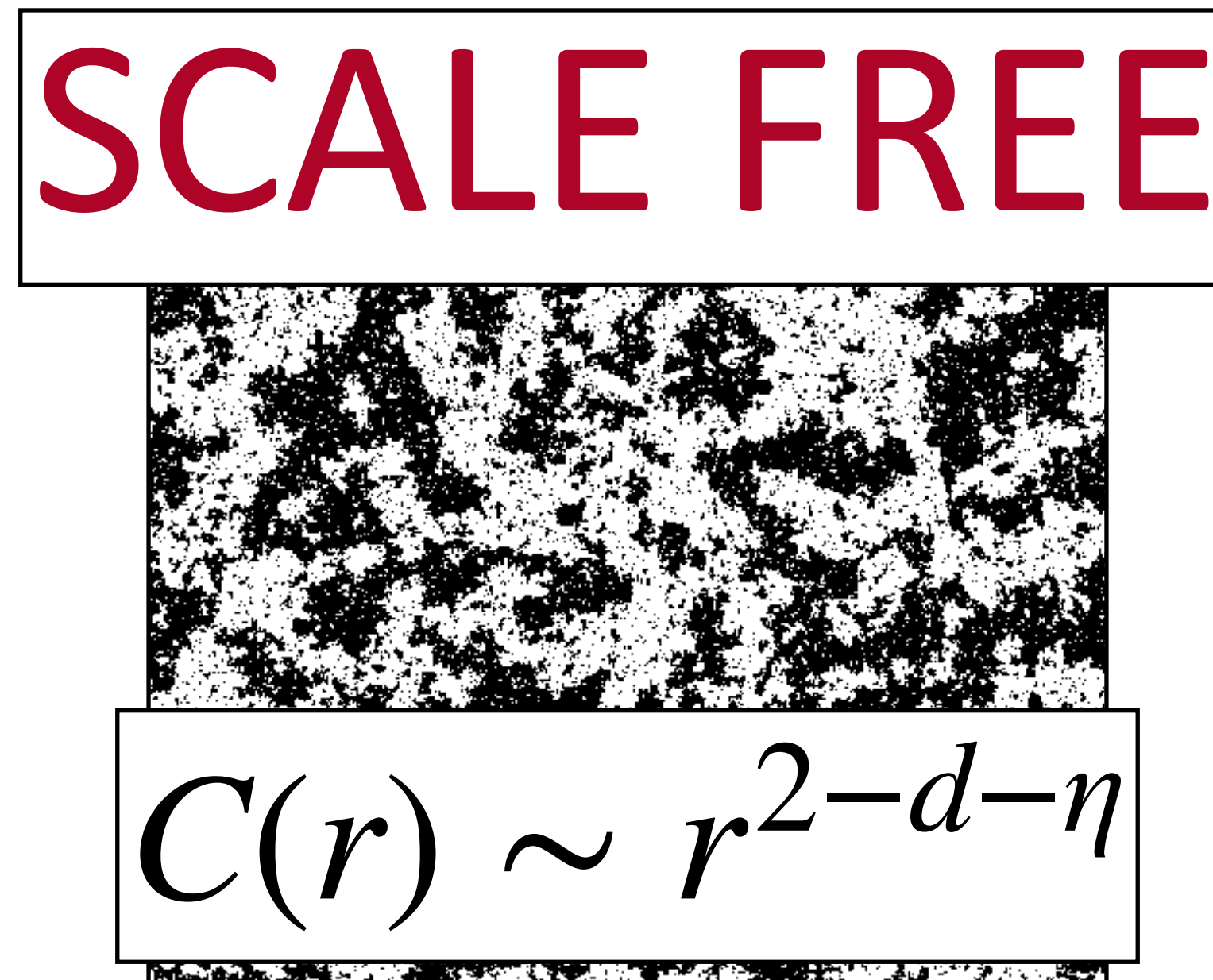
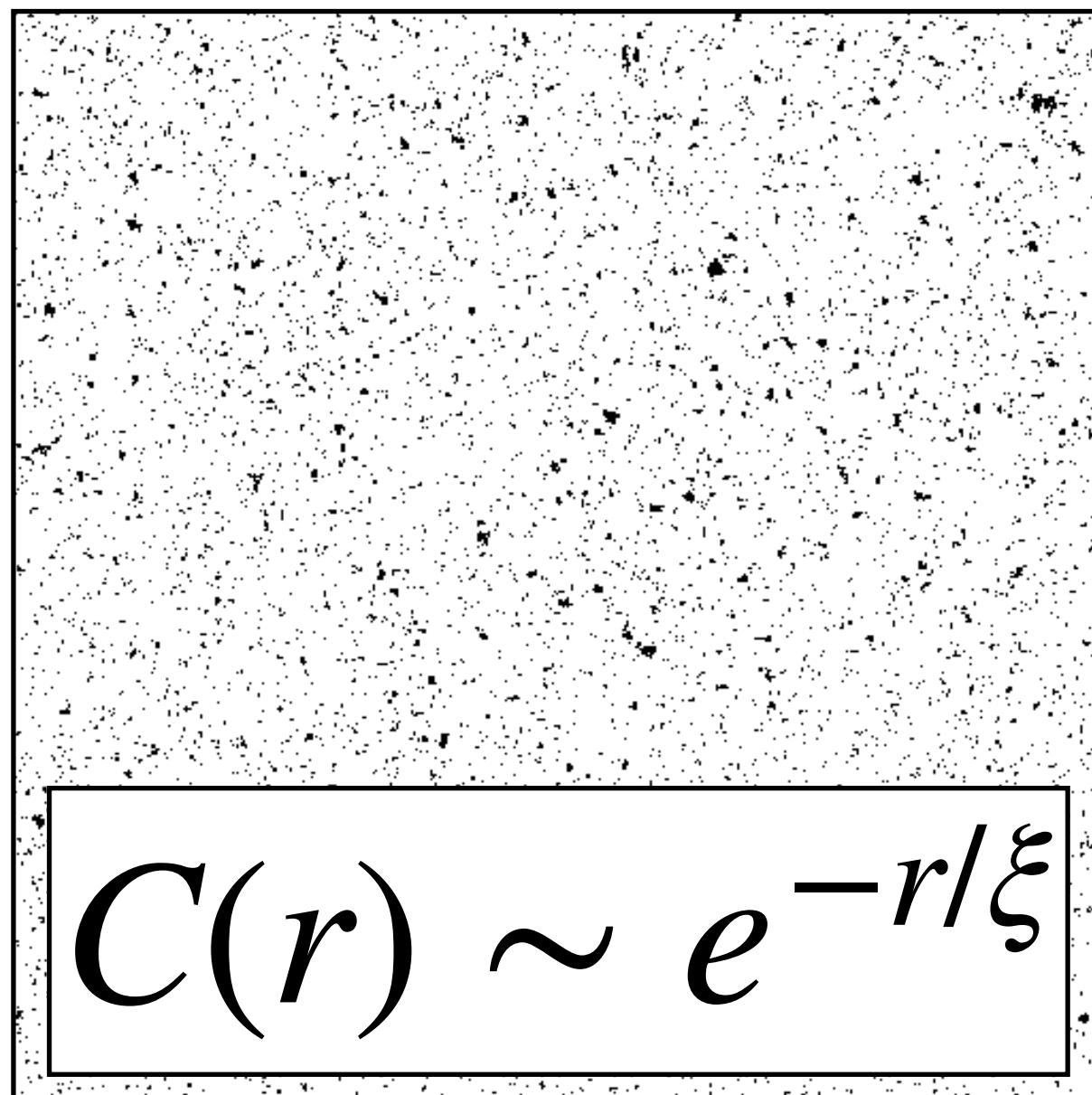
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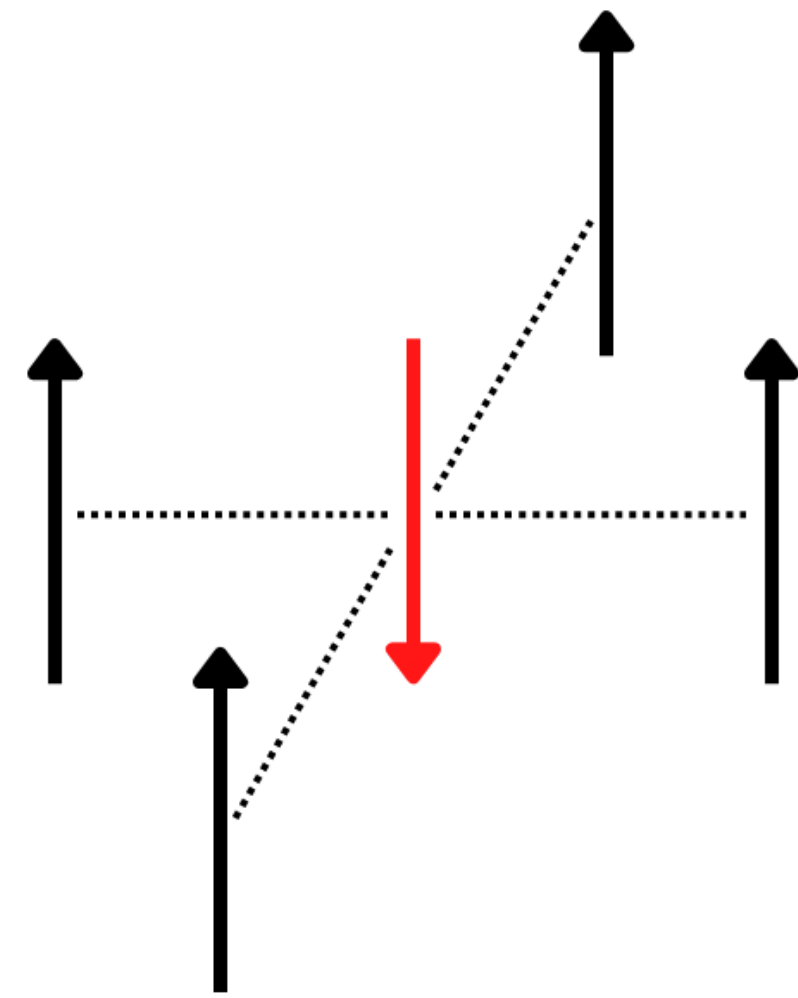
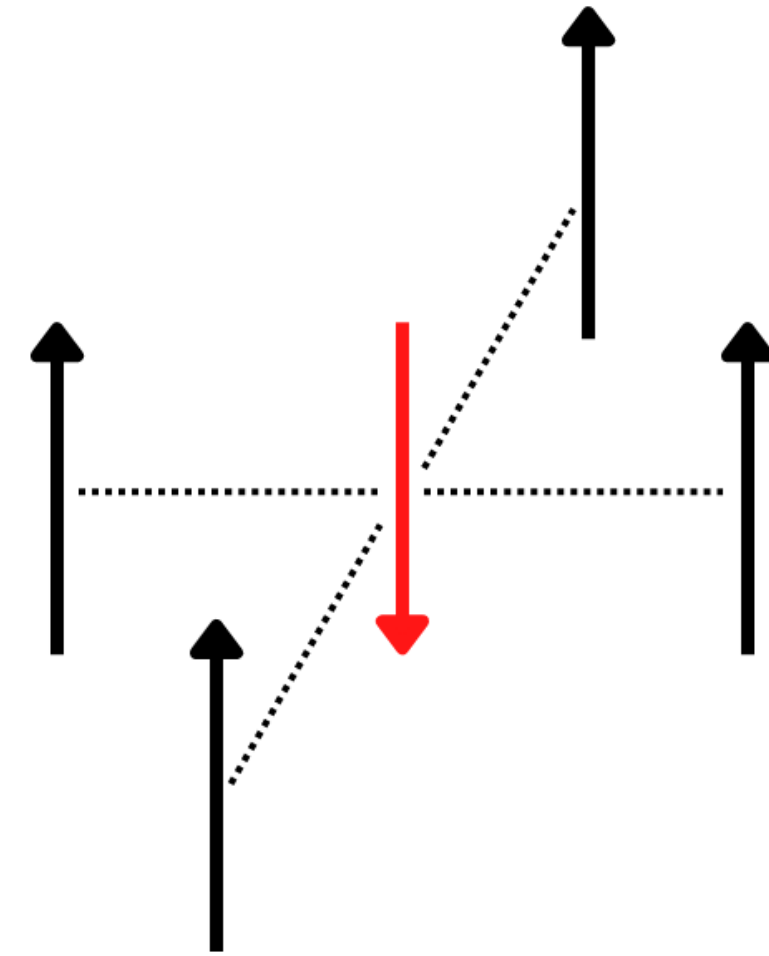
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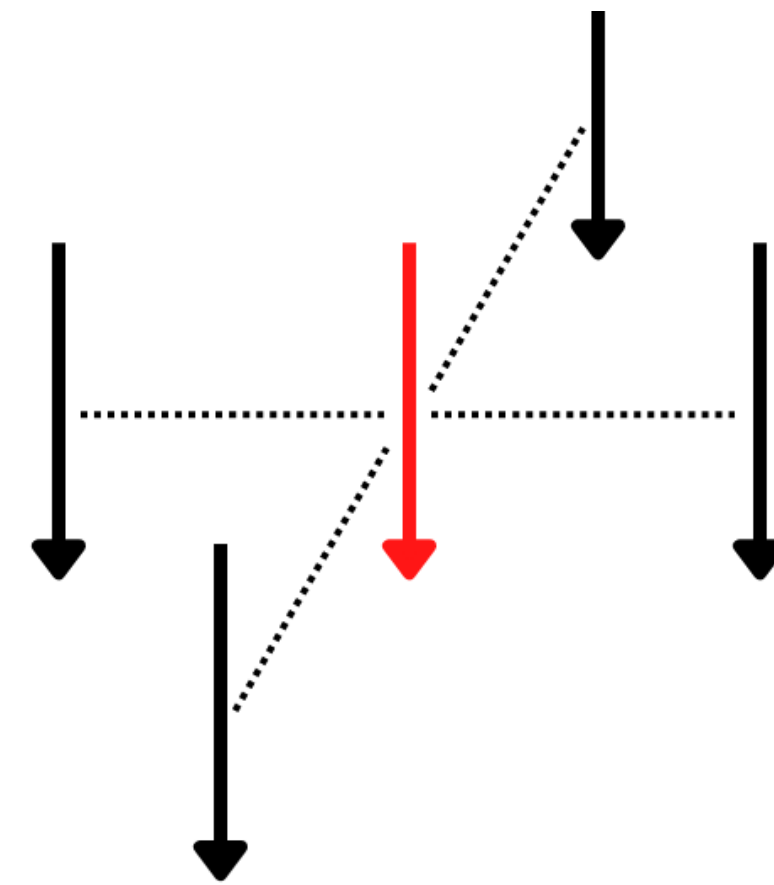


# Collective behaviours in the Ising Model

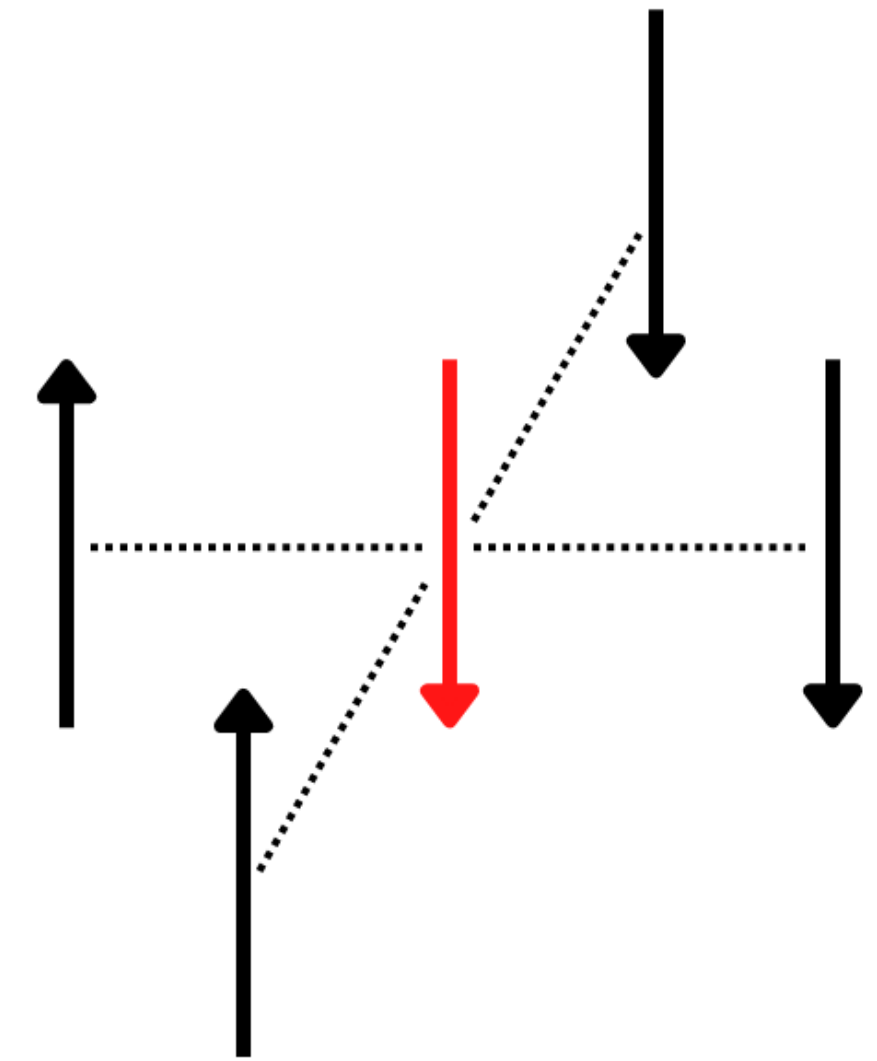
Start from the configuration:



$$T \ll T_c$$



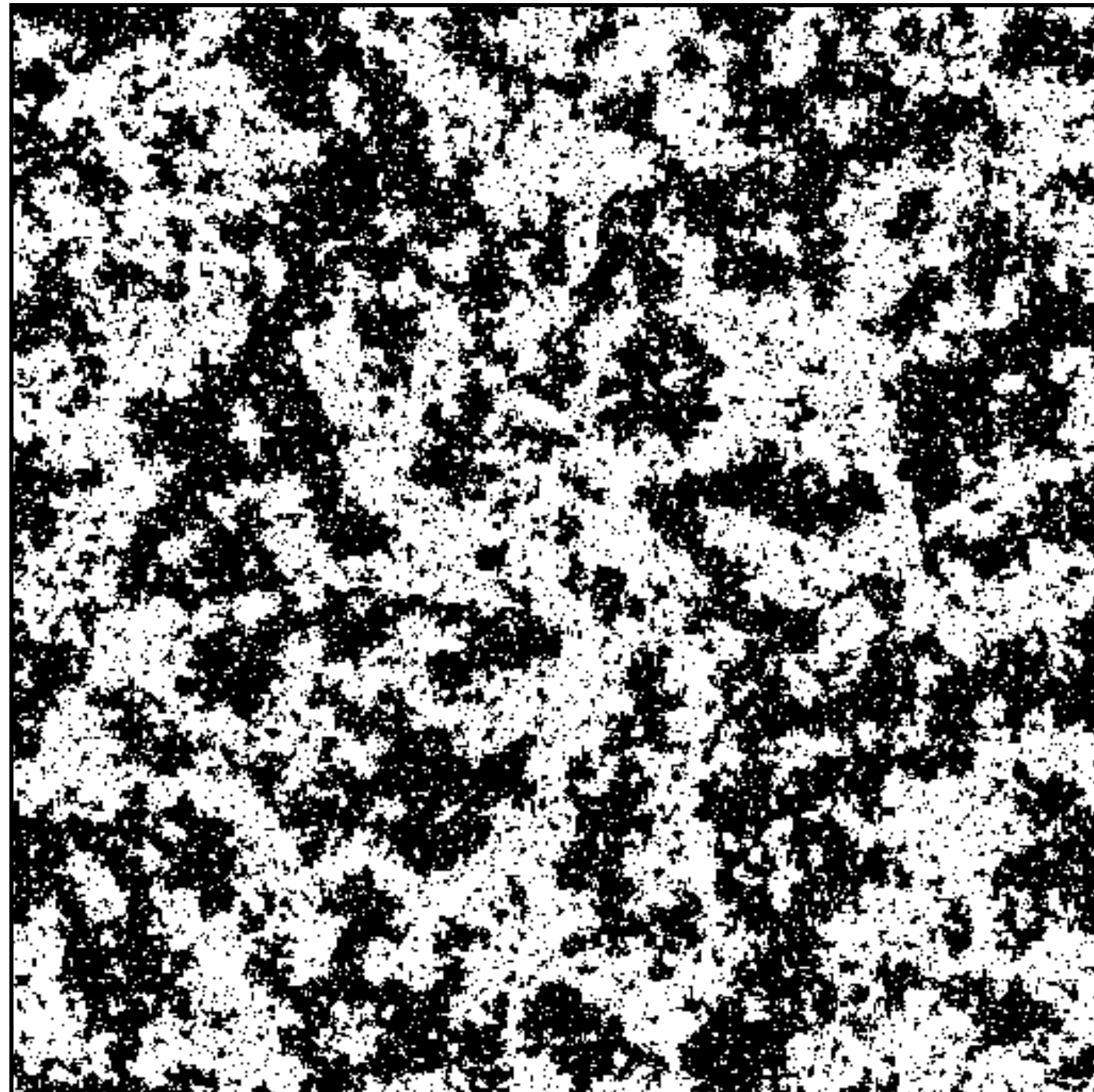
$$T \sim T_c$$



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# Collective behaviours in the Ising Model

$$T \sim T_c$$



Diverging correlation length:

$$\xi \sim \tau^{-\nu} \quad \tau \propto |T - T_c|$$

Diverging respons to external fields:

$$\chi = \frac{\partial M}{\partial H} \sim \tau^{-\gamma}$$

# Can we model flocks through an Ising model?

## Analogies:

- Birds play the role of spins, with the direction of the spin pointing in the direction of motion;
- Birds tend to align their direction to that of neighbours;

## Differences:

- birds' direction of motion can point in any direction of space;
- birds in flocks are all aligned, while collective behaviours in Ising model occur only near the transition

# Collective behaviours in flocks

Simple model for flocks (XY or Heisenberg models):

$$H(\vec{\sigma}) = - \sum J_{ij} \vec{v}_i \cdot \vec{v}_j \quad |\vec{v}_i| = 1$$

In  $d = 2$  the velocity of each bird is  $\vec{v}_i = (\cos \varphi_i, \sin \varphi_i)$

and hence: 
$$H(\vec{\sigma}) = - \sum J_{ij} \cos(\varphi_i - \varphi_j)$$



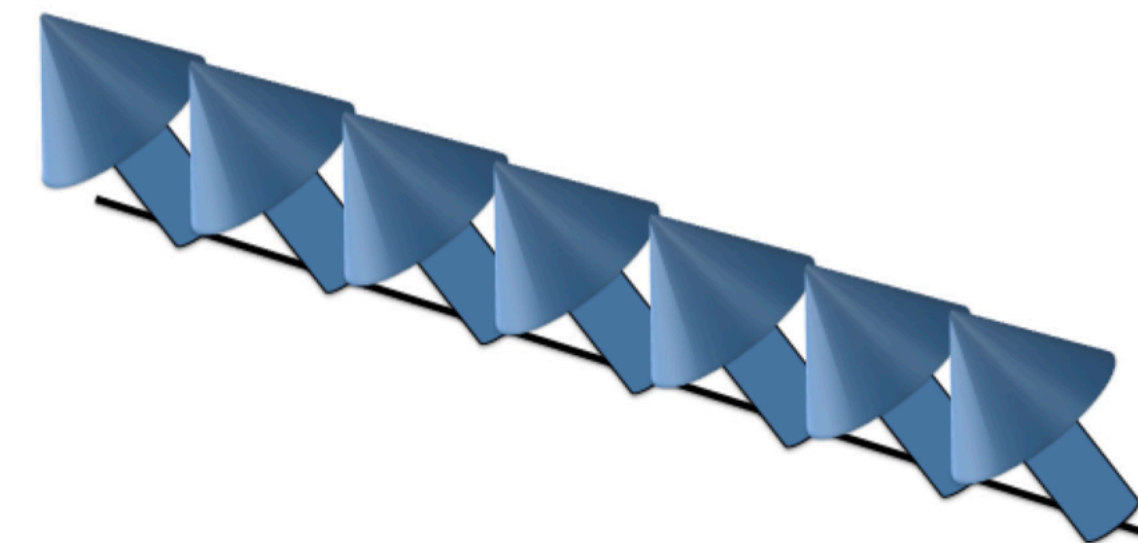
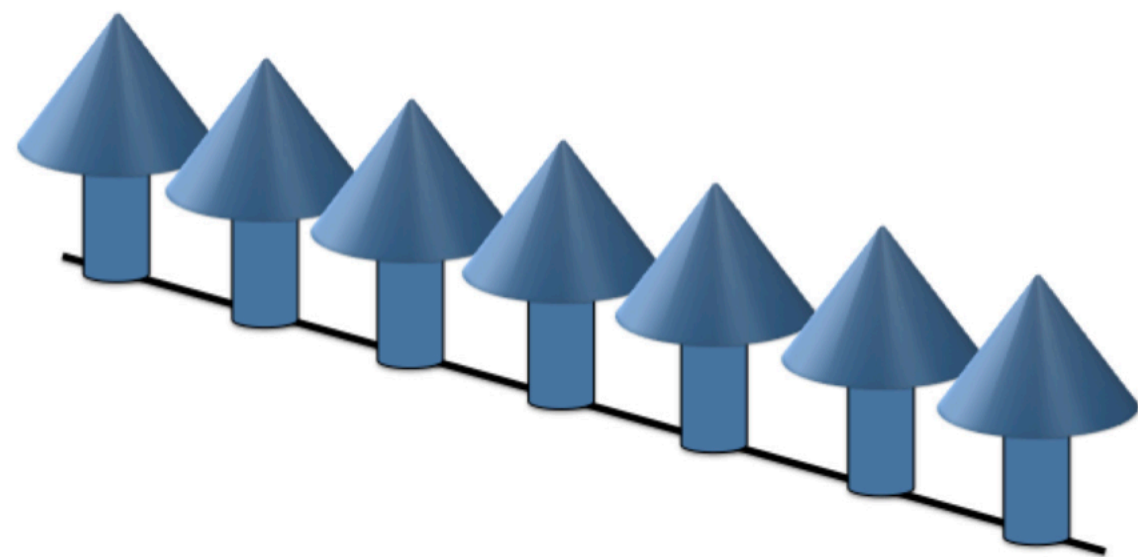
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Also this model has a transition between a disordered high temperature phase and an ordered low temperature phase.

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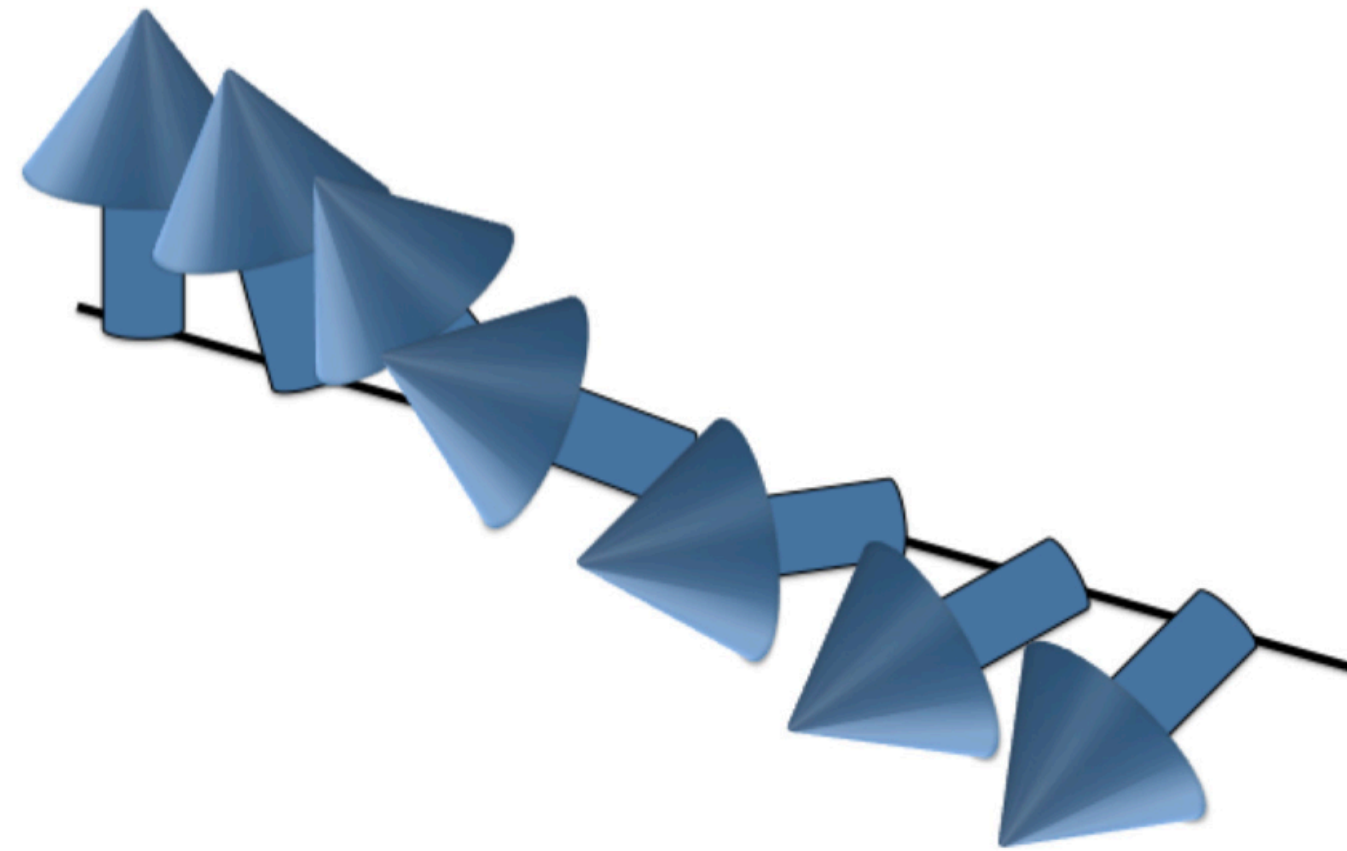
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At low “temperatures”, all birds are aligned but may point in any direction



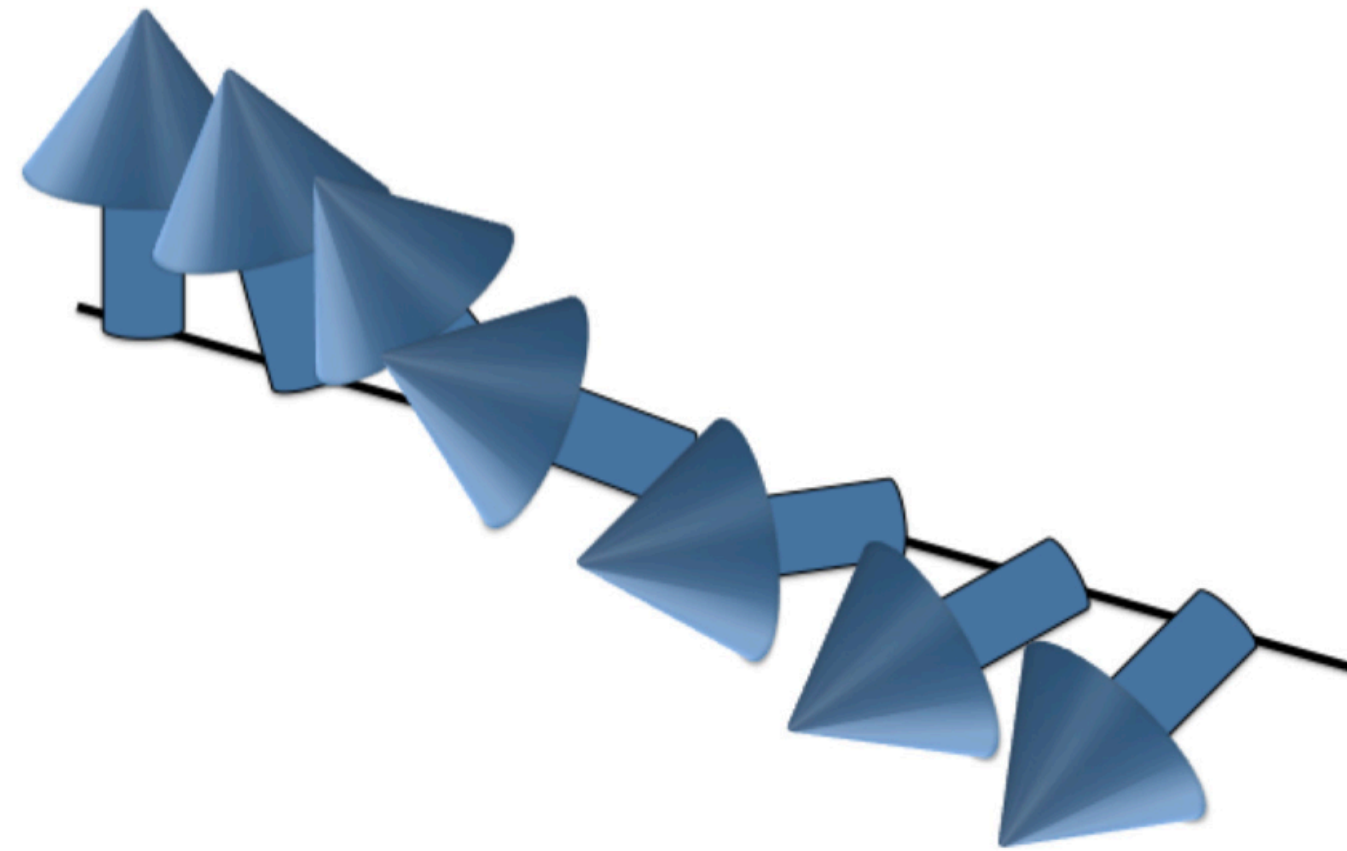
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The following excitation has a cost which is smaller the longer the wavelength



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This excitation, known as Goldstone mode, has a “gapless” spectrum: it is a collective behaviour!

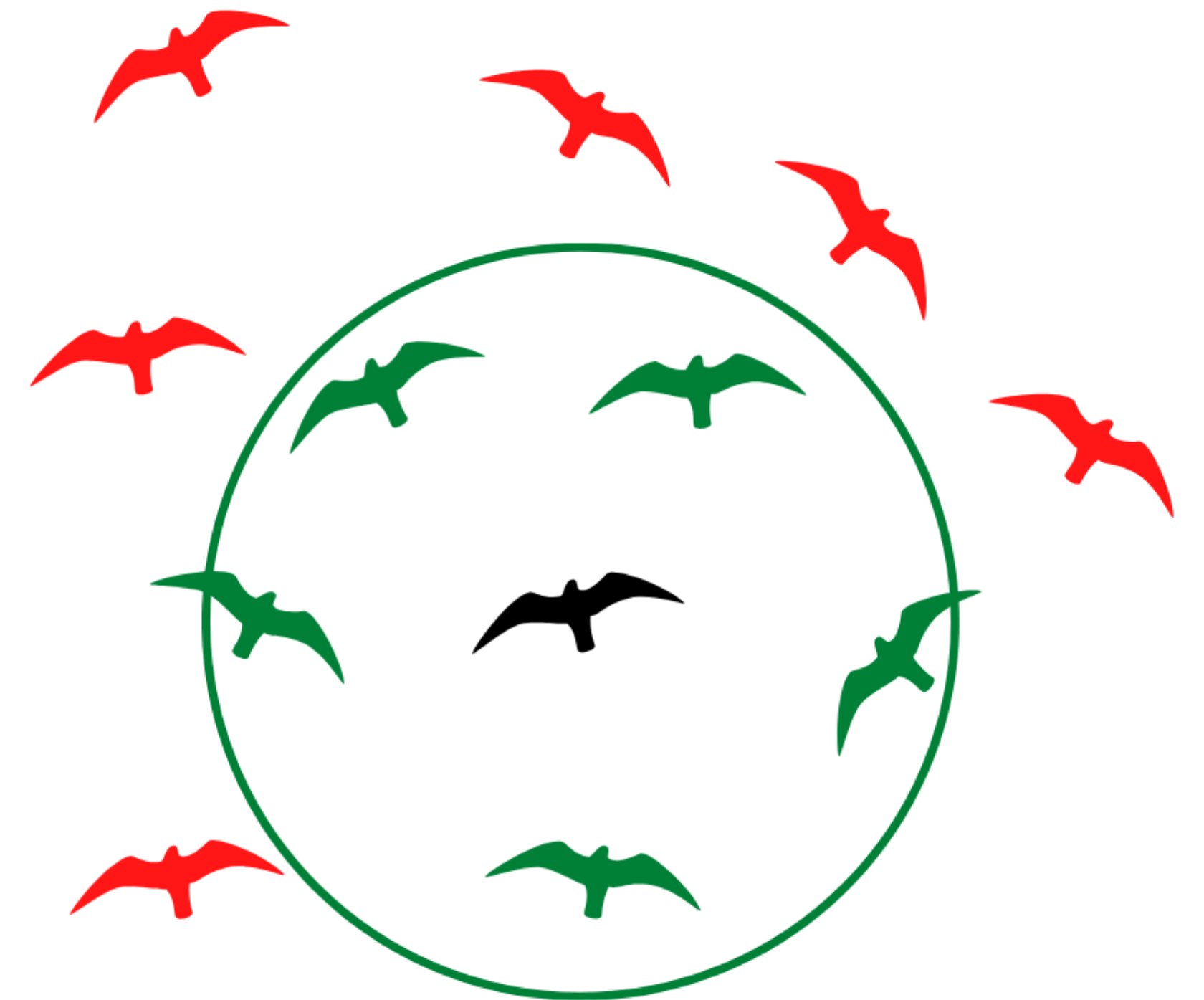
# Vicsek Model for flocking

One missing ingredient so far: activity.

$$\frac{d\vec{v}_i}{dt} = -\frac{dH}{d\vec{v}_i} + \eta \quad |\vec{v}_i| = 1$$

$$\frac{d\vec{r}_i}{dt} = \vec{v}_i$$

$$H(\vec{\sigma}) = -\sum J(|\vec{r}_i - \vec{r}_j|) \vec{v}_i \cdot \vec{v}_j$$



# Vicsek Model for flocking

My research focuses on:

- Dynamic collective behaviours occurring in the presence of activity;
- How to “upgrade” the Vicsek model to describe collective behaviours in real biological systems.

# Conclusions

Collective behaviours are symptoms of the presence of long wavelength modes that are easy to “activate”

Collective behaviours occur in a wide variety of biological systems for surviving reasons

Collective behaviours can be detected by looking at correlations