

# Swarming in the dirt: Flocking in the Presence of Quenched Disorder

With: Nicholas Guttenberg,  
University of Oregon

# What do I mean by **Flocking**?

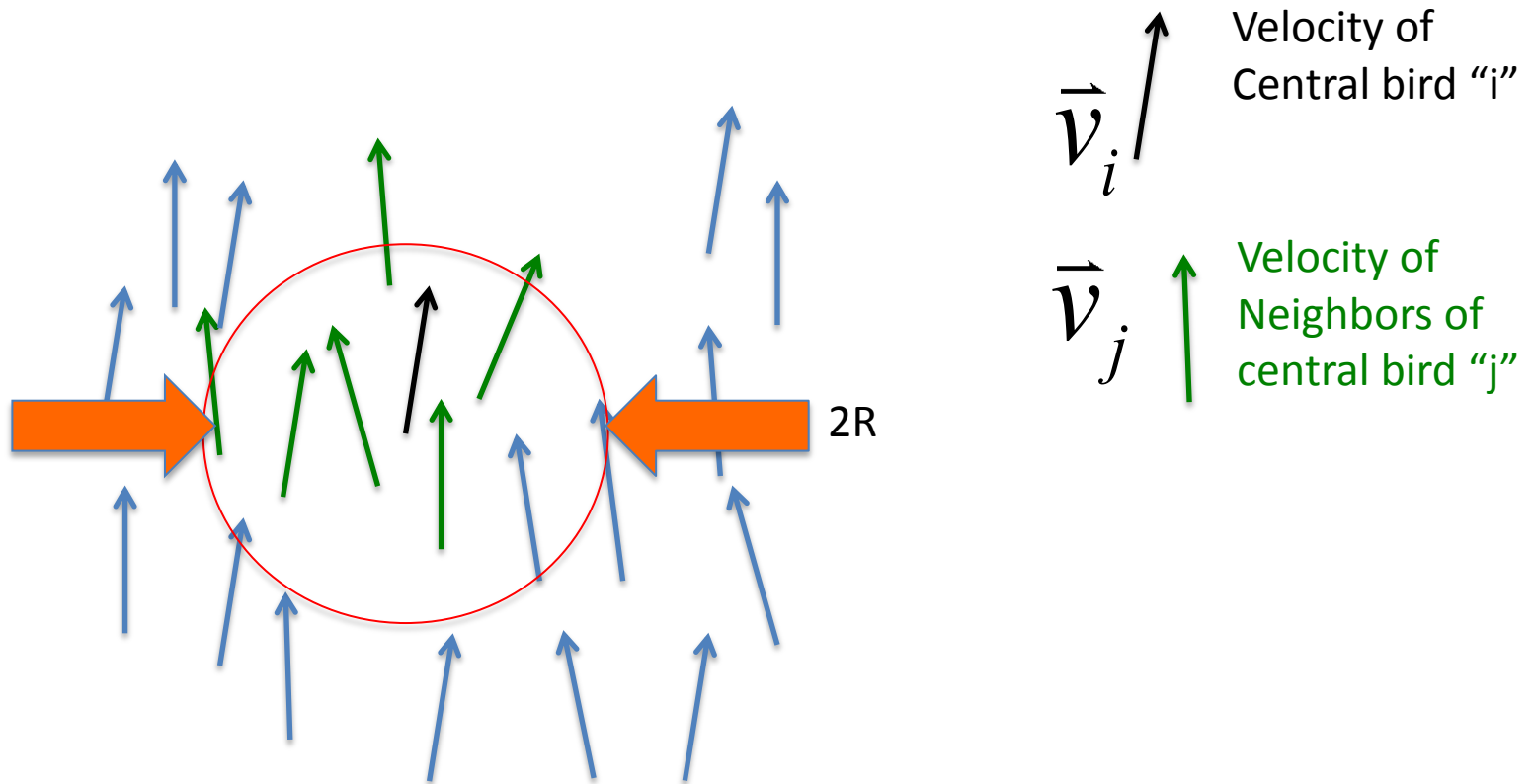
In Vivo: All moving in the same direction



1: Several hundred thousand wildbeest in a moving front, grazing on the Serengeti. R.E. Sinclair (1977), reproduced by permission of the author and publisher.

the photograph of wildbeest grazing on the Serengeti Plains of Africa, hundreds of  
ids of animals f

# In silica: Vicsek algorithm (e.g.)



# What do I mean by **Flocking**?

- Spontaneous (no road signs (“no external fields”)) telling critters which way to go)
- Short ranged interactions
- (no e.g., chemotaxis)

# Flocking in two dimensions is **ASTOUNDING!**

Why? In equilibrium, lower critical dimension

$$d_{LC} = 2$$

Long-ranged order (LRO) impossible

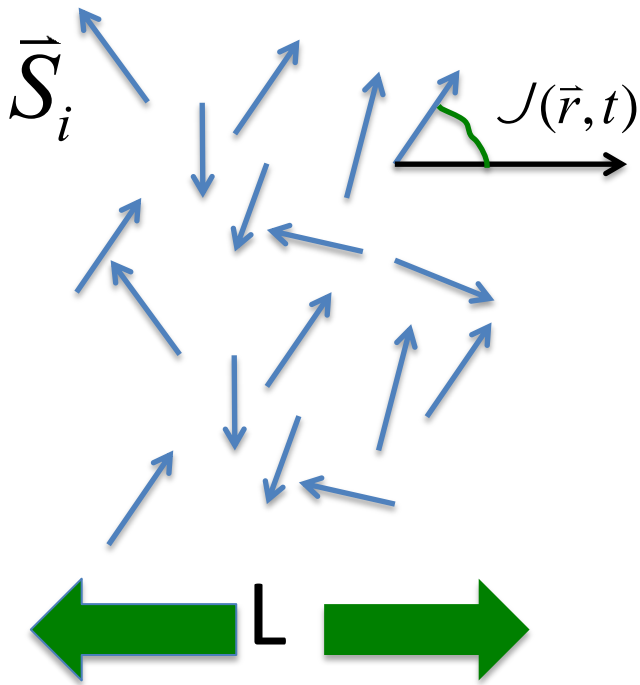
For  $d \notin d_{LC} = 2$

(Mermin-Wagner Theorem)

# Mermin-Wagner theorem:

## Pointers vs. Flockers

- APS pointers (“XY model”): Error size



**CAN NOT** all **POINT**

in same direction

“Open up to infinity and become infinity”

but

No Long

Ranged order

**CAN** all **MOVE**

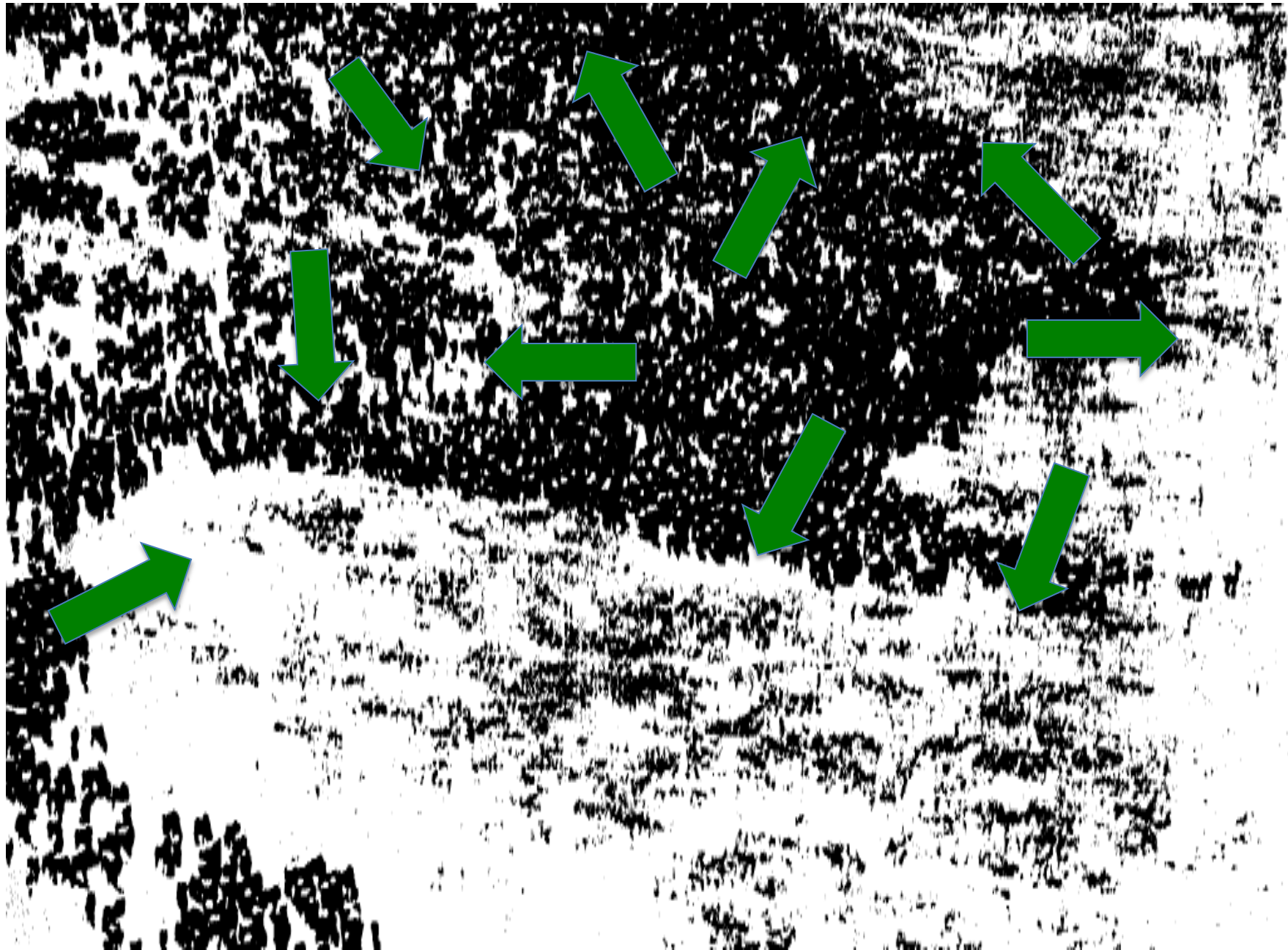
in same direction

Equilibrium result

$$\langle \vec{S}(\vec{r}, t) \rangle = \vec{0}$$

# This is without signs (“external fields”)

- With signs, easy to order in **ANY** dimension  $d$
- **IF** the signs are accurate (consistent)
- What if the signs point in random directions?
- “Quenched disorder”
- (“Quenched” means the signs never change)





With quenched disorder, Flocking in  
**ANY** physical dimension  
( $d=2$  **AND**  $d=3$ ) is even **MORE**  
Astounding!

$d_{LC} = 4$  in equilibrium with quenched disorder

(Grinstein and Luther, 1979)

Yet it also happens!

# Outline

- I) Review of flocks with “annealed disorder” (i.e., Langevin (time-**dependent**) noise (with Yu-hai Tu, IBM Watson)
- (J. Toner, Y.-h. Tu, and S. Ramaswamy, Ann. Phys. 318, 170 (2005))
- Surprising result: **LRO** in **d=2** (**IMPOSSIBLE** in equilibrium)
  
- II) Flocks with Quenched (i.e., time-**independent**) disorder (with Nicholas Guttenberg, UO)
- Even more surprising results:
  - **LONG RANGED ORDER** in **d=3** (**IMPOSSIBLE** in equilibrium)
  - **QUASI-LONG RANGED ORDER** in **d=2** (vs **Short ranged order** in equilibrium)

# Flocks with annealed disorder (i.e., Langevin (time-dependent) noise)

## I) Microscopic models (Vicsek)

Important points: rotation invariance  
locality

## II) Mermin-Wagner Theorem: Are birds smarter than nerds?

## III) Continuum theory: analogy with fluid mechanics

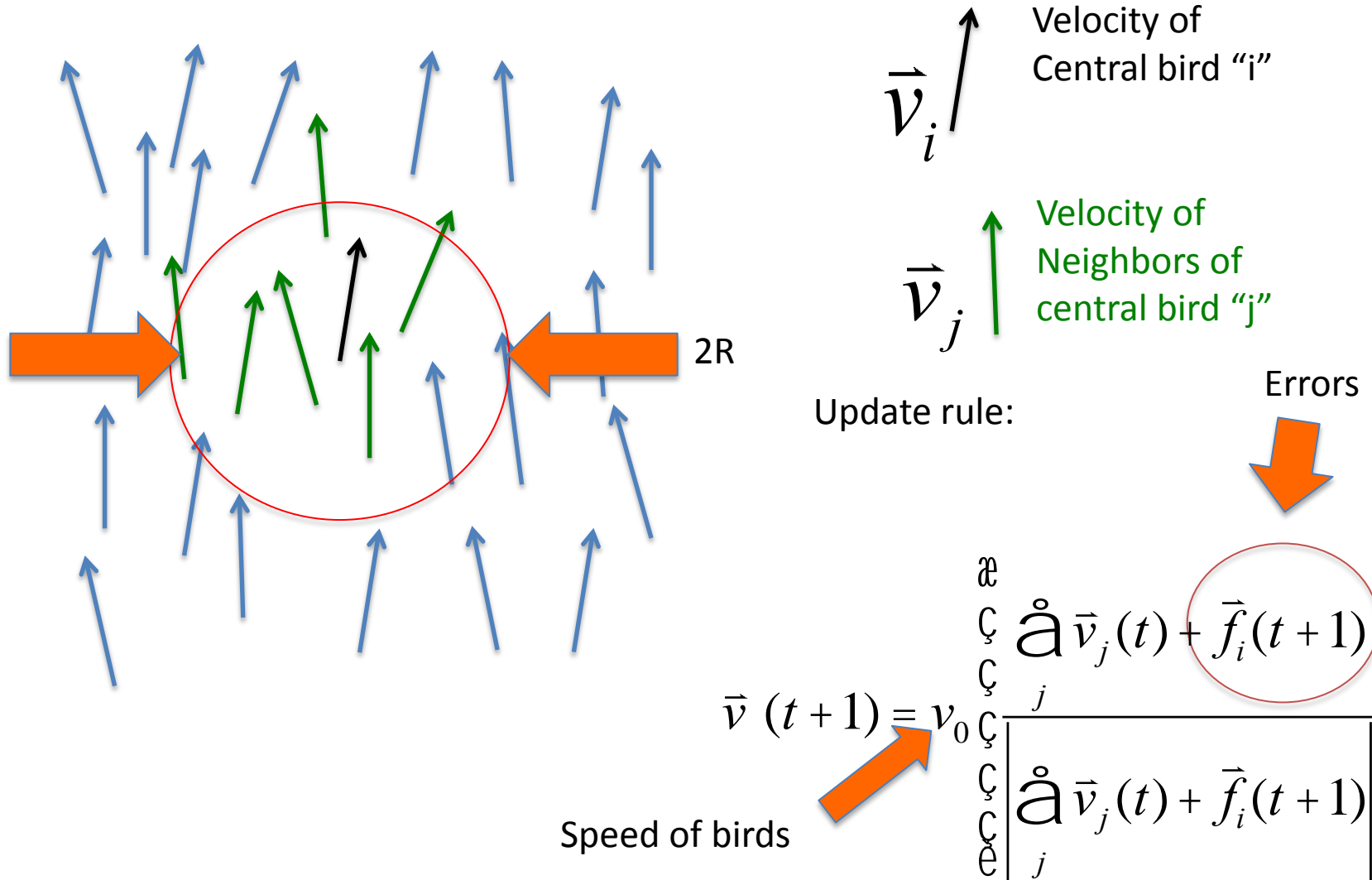
## IV) Predictions:

A) Sound modes, whose speeds **vanish** in certain directions: **crucial** for  
**quenched disorder**

B) How **motion** beats **Mermin-Wagner**  
**(“anomalous hydrodynamics”)**

# I) Microscopic Models

Vicsek algorithm:



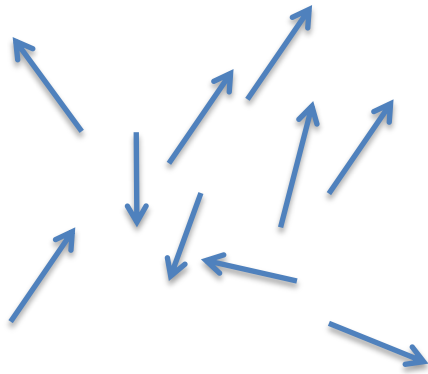
# Essential Features of Algorithm

- Only **Local** interactions: **short ranged** in **space** and **time**
- Ferromagnetic interactions (favor alignment)
- “Birds” **keep moving** ( $\vec{v} \neq \vec{0}$ ) and making errors

# Symmetries:

	Dynamics	Phase
Translation Invariance	YES	YES $\langle r(\vec{r}, t) \rangle^{\circ} r_0$ $= \text{CONSTANT}$
Rotation Invariance	YES	NO $\langle \vec{v}(\vec{r}, t) \rangle^{\circ} \vec{v}_0 \neq \vec{0}$
Galilean Invariance	NO	NO

# Dynamics produces order:

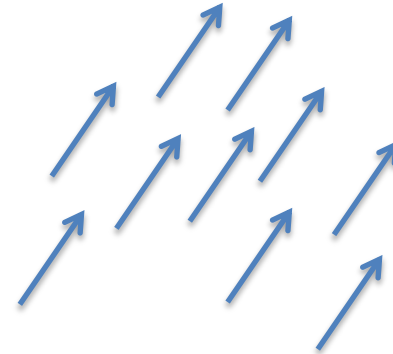


**t=0**

$$\langle \vec{v}(\vec{r}, t) \rangle = \vec{0}$$



Run algorithm  
Many steps ( $t \gg 1$ )



**t >> 1**

$$\langle \vec{v}(\vec{r}, t) \rangle = \vec{v}_0 \neq \vec{0}$$

# However.....

This should be **Impossible!**

Why?

Violates **Mermin-Wagner** theorem

**Are Birds smarter than nerds?**



# Continuum Theory of Flocks

- Hard (impossible) to solve microscopic model with  $\sim 10^5$  birds
- Harder to figure out what happens if you change model (universal vs system-specific)
- Historical analog: **Fluid mechanics** (Navier, Stokes, **1822**):
  - No** theory of atoms and molecules
  - No** statistical physics
  - No** computers, ipad, ipod, etc
- So, how'd they do it?

# Continuum Approach

Replace  $\vec{r}_i(t) \rightarrow$  **Continuous fields:**

$r(\vec{r}, t)$  : Coarse grained number density

$\vec{v}(\vec{r}, t)$  : Coarse grained velocity

Valid for: Length scales  $L \gg$  interatomic distance

Time scales  $t \gg$  collision time

Equations of motion for  $r(\vec{r}, t), \vec{v}(\vec{r}, t)$

Make 'em up!

Rules:      -Lowest order in space, time derivatives  
                 -Lowest order in fluctuations

$$dr(\vec{r}, t) \circ r(\vec{r}, t) - \langle r(\vec{r}, t) \rangle$$

$$d\vec{v}(\vec{r}, t) \circ \vec{v}(\vec{r}, t) - \langle \vec{v}(\vec{r}, t) \rangle$$

Respect **Symmetries** (for flocks,  
**Rotation invariance**)

Worked for fluids, should work for flocks

Our (Yu-hai Tu and JT) idea: same approach, different symmetry

- No **Galilean** invariance (birds move through a Special “rest frame” (e.g., air, water, surface of Serengeti. Etc....))

# Hydrodynamic equations for Flocks:

Connection to Equilibrium Ferromagnetism (Pointers) (and Mermin-Wagner Theorem):

(“convective Derivative”)

New terms (forbidden in NS equations due to Galilean invariance)  
 Velocity EOM: “Other ‘Galilean’ terms in velocity EOM”  
 “move faster, not so fast!”

$$\partial_t \vec{v} + \cancel{I_1 (\vec{v} \cdot \vec{\nabla}) \vec{v}} + I_2 \vec{v} (\vec{\nabla} \cdot \vec{v}) + I_3 (\vec{\nabla} \cdot |\vec{v}|^2) = a \vec{v} - b |\vec{v}|^2 \vec{v}$$

$$- \vec{\nabla} P(r) - \vec{v} (\vec{v} \cdot \vec{\nabla} P_2(r)) + D_B \vec{\nabla} (\vec{\nabla} \cdot \vec{v}) + D_T \nabla^2 \vec{v} + D_2 (\vec{v} \cdot \vec{\nabla})^2 \vec{v} + \vec{f}$$

Anisotropic pressure Density EOM: Anisotropic Noise (errors) Viscosity

$$\partial_t r + \vec{\nabla} \cdot (r \vec{v}) = 0$$

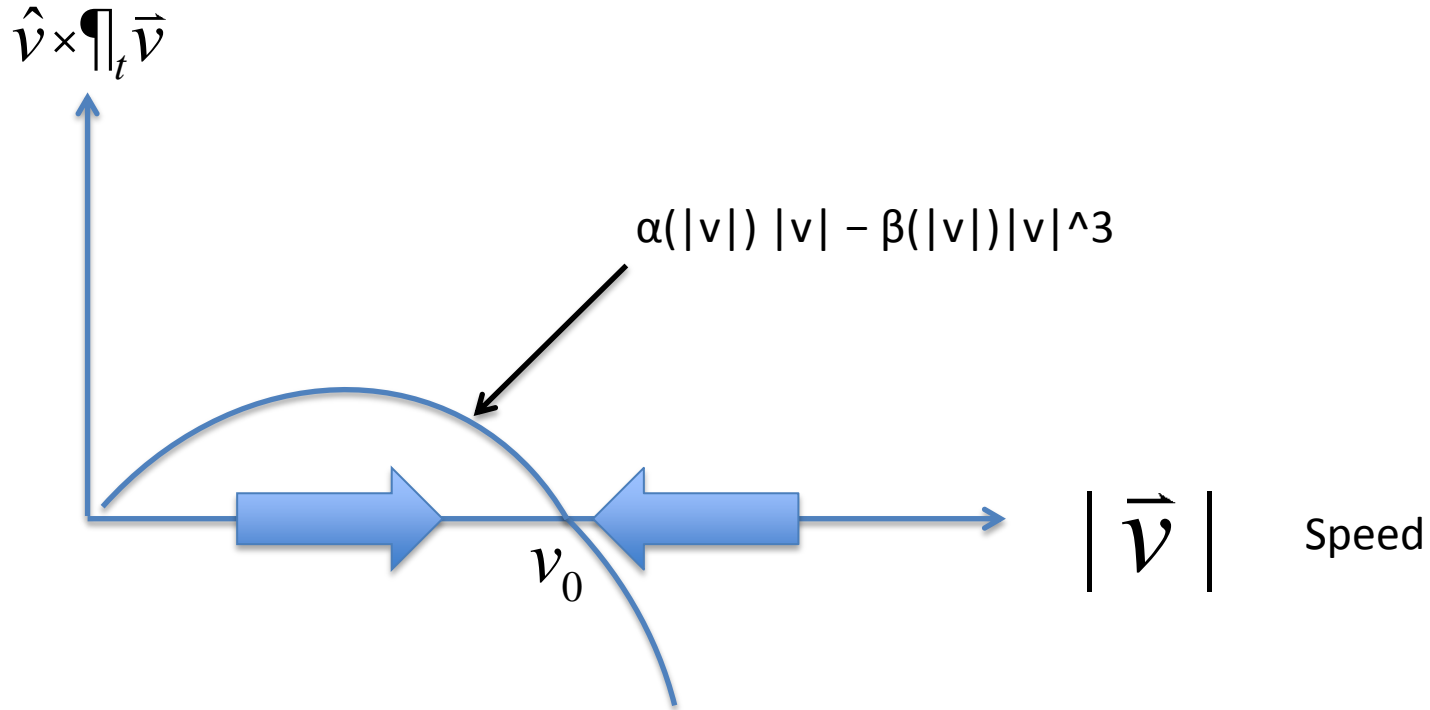
Number conservation (“immortal” flock)

$\vec{f}(\vec{r}, t)$  : Langevin white noise  
(i.e., short range correlated in  
TIME (and space))

$$\langle f_i(\vec{r}, t) f_j(\vec{r}', t') \rangle = D d_{ij} d^d(\vec{r} - \vec{r}') d(t - t')$$

Noise strength

Acceleration in direction of motion:



$\mathcal{P} \langle \vec{v}(\vec{r}, t) \rangle = v_0 \hat{x}$ 

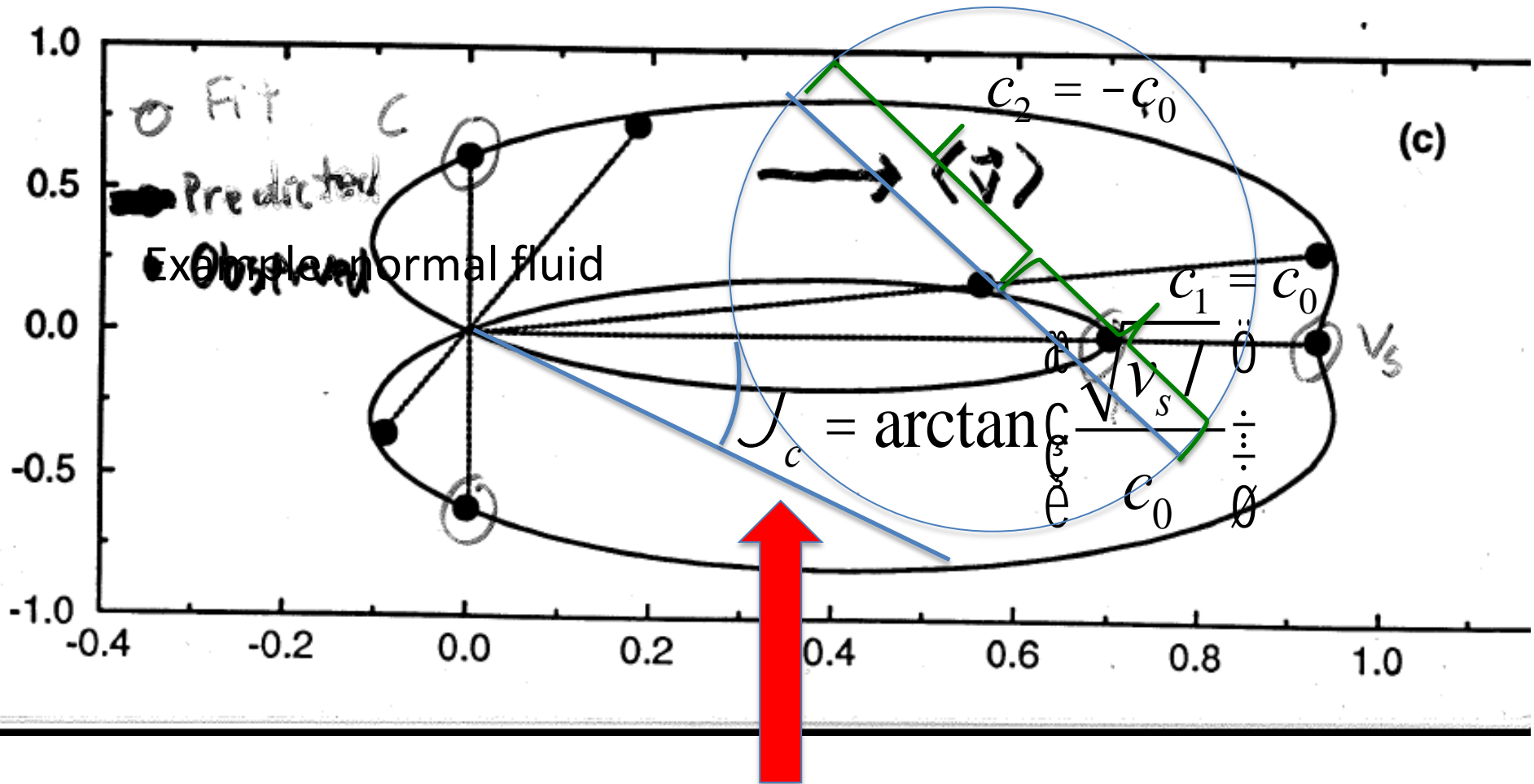
 ← Arbitrary direction  
 (Spontaneously  
 Broken symmetry)

# Predictions of hydrodynamic theory

- Sound waves
- **Anomalous** Hydrodynamics for  $d < 4$ .
- **Long-ranged** order in  $d = 2$



# Polar plot of sound speeds: Flock



$$J = \pm J_c \pm \rho$$

One sound speed **vanishes: crucial** for **quenched disorder problem**

Why does sound speed vanish  
in certain directions?

$$J = \pm J_c \pm \rho$$

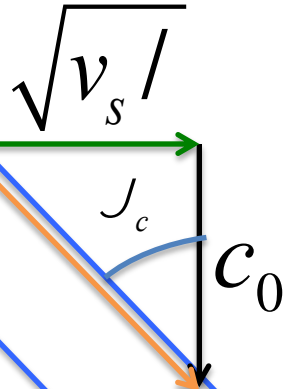
Competition between **CONVECTION**  
and **PROPAGATION**



$V_C$   $\circ$  Velocity of current (i.e., convection)

$V_P$   $\circ$  Propagation velocity of wave

Convection at speed (geometric mean of density and velocity convection speeds)



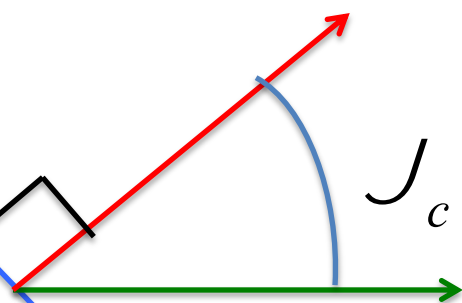
Propagation perpendicular to mean flock motion at speed

Net motion is **ALONG** wavefronts



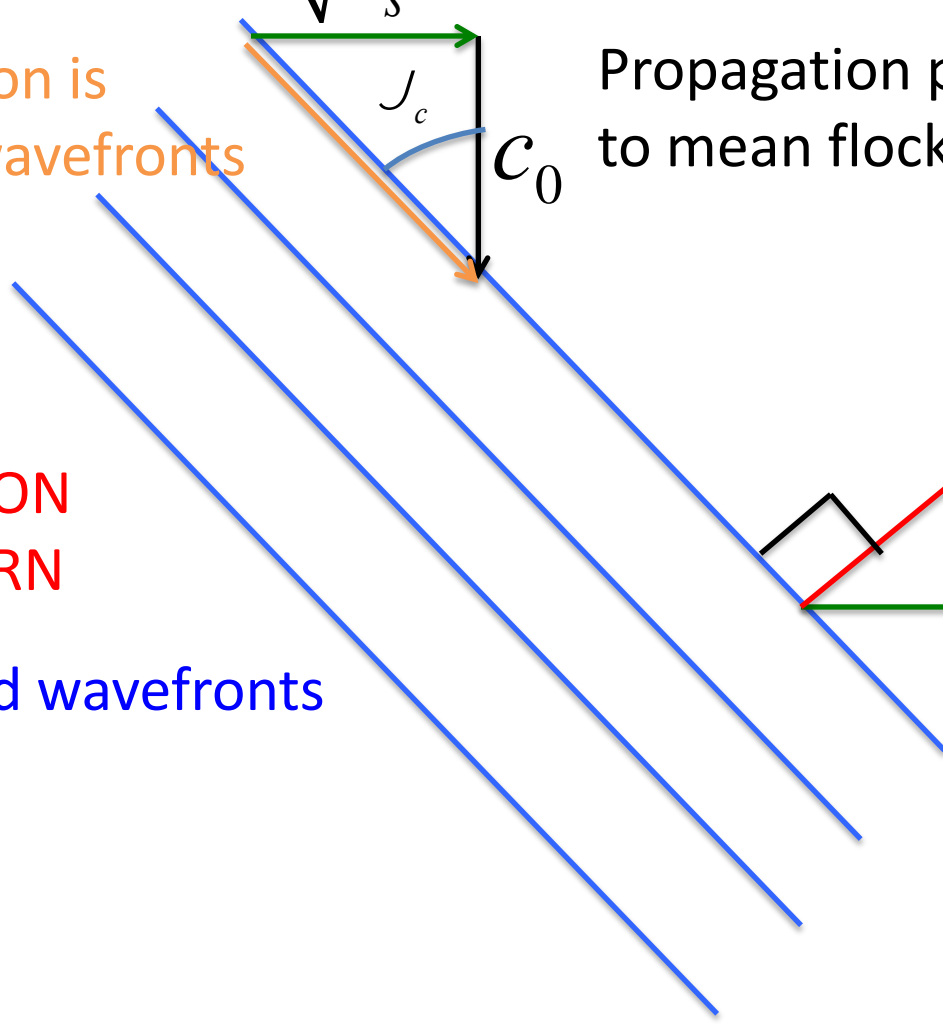
**NO MOTION OF PATTERN**

normal to wavefronts



direction of flock motion

Sound wavefronts



# Anomalous Hydrodynamics

Hydrodynamics  
**With** noise



Hydrodynamics  
**Without** noise

In ALL  $d \in 4$

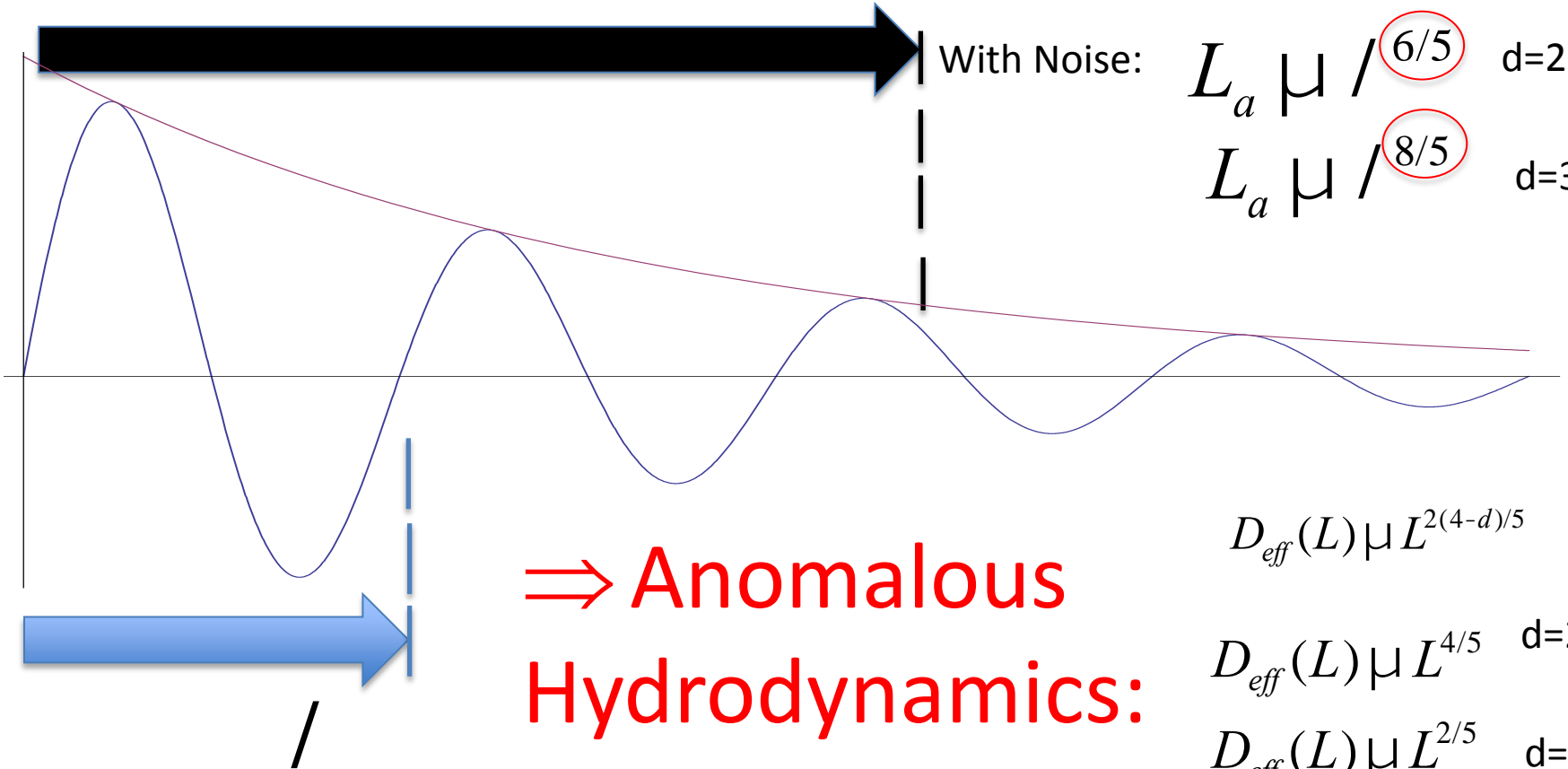
Example: Sound damping in flocks:

Without Noise:  $L_a \mu / \textcircled{2} / D$

Attenuation length  $L_a$

With Noise:  $L_a \mu / \textcircled{6/5} \quad d=2$

$L_a \mu / \textcircled{8/5} \quad d=3$



$\Rightarrow$  Anomalous Hydrodynamics:

$D_{eff}(L) \mu L^{2(4-d)/5}$

$D_{eff}(L) \mu L^{4/5} \quad d=2$

$D_{eff}(L) \mu L^{2/5} \quad d=3$

# Why does this happen?

Fluctuations (waves) interact due to

**Convective nonlinearity**



$$\partial_t \vec{v} + l_1 (\vec{v} \cdot \vec{\nabla}) \vec{v} + l_2 \vec{v} (\vec{\nabla} \cdot \vec{v}) + l_3 (\vec{\nabla} |\vec{v}|^2) = a\vec{v} - b |\vec{v}|^2 \vec{v} - \vec{\nabla} P(r) - \vec{v} (\vec{v} \cdot \vec{\nabla} P_2(r)) + D_B \vec{\nabla} (\vec{\nabla} \cdot \vec{v}) + D_T \nabla^2 \vec{v} + D_2 (\vec{v} \cdot \vec{\nabla})^2 \vec{v} + \vec{f}$$

# Long-ranged order in $d=2$

- Stabilized by this breakdown of hydrodynamics (damps out noise induced fluctuations (negative feedback: fluctuations create divergence of  $D$ , which suppresses fluctuations))



Model for flock with quenched disorder: Same as before, except random forcing now has quenched piece, as well as Langevin piece:

$$\begin{aligned}
 \partial_t \vec{v} + I_1 (\vec{v} \cdot \vec{\nabla}) \vec{v} + I_2 \vec{v} (\vec{\nabla} \cdot \vec{v}) + I_3 (\vec{\nabla} |\vec{v}|^2) &= a \vec{v} - b |\vec{v}|^2 \vec{v} \\
 - \vec{\nabla} P(r) - \vec{v} (\vec{v} \cdot \vec{\nabla} P_2(r)) + D_B \vec{\nabla} (\vec{\nabla} \cdot \vec{v}) + D_T \nabla^2 \vec{v} + D_2 (\vec{v} \cdot \vec{\nabla})^2 \vec{v} + \vec{f} \\
 + f_Q(\vec{r})
 \end{aligned}$$

# Quenched disorder=Static random forcing

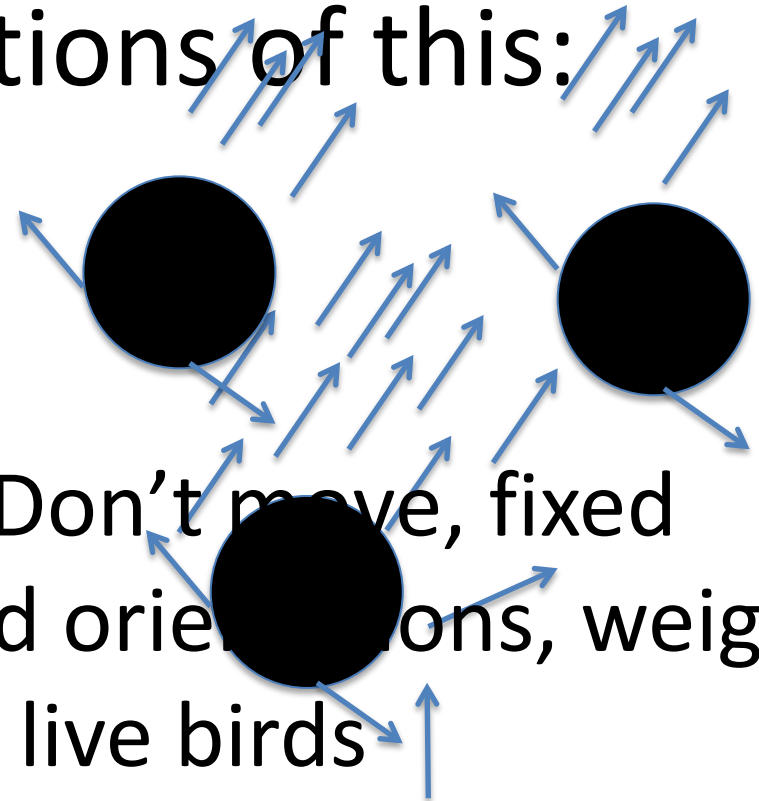
Note: **No** delta fn in t-t'

$$\langle f_i^Q(\vec{r}, t) f_j^Q(\vec{r}', t') \rangle = D d_{ij} d^d(\vec{r} - \vec{r}') \quad \text{}$$

**Infinitely long** correlations in **time**

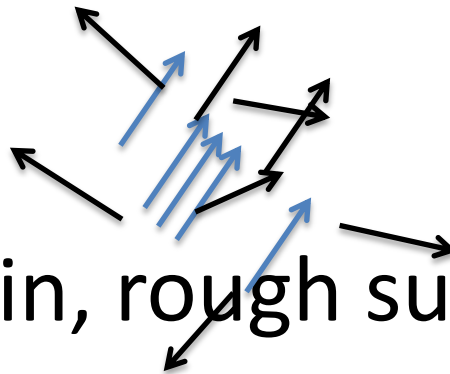
# Physical realizations of this:

1) Obstacles:



2) “Dead birds”: ↑ Don't move, fixed random positions and orientations, weight  $W < 1$  in averaging for live birds

3) random terrain, rough substrate, etc



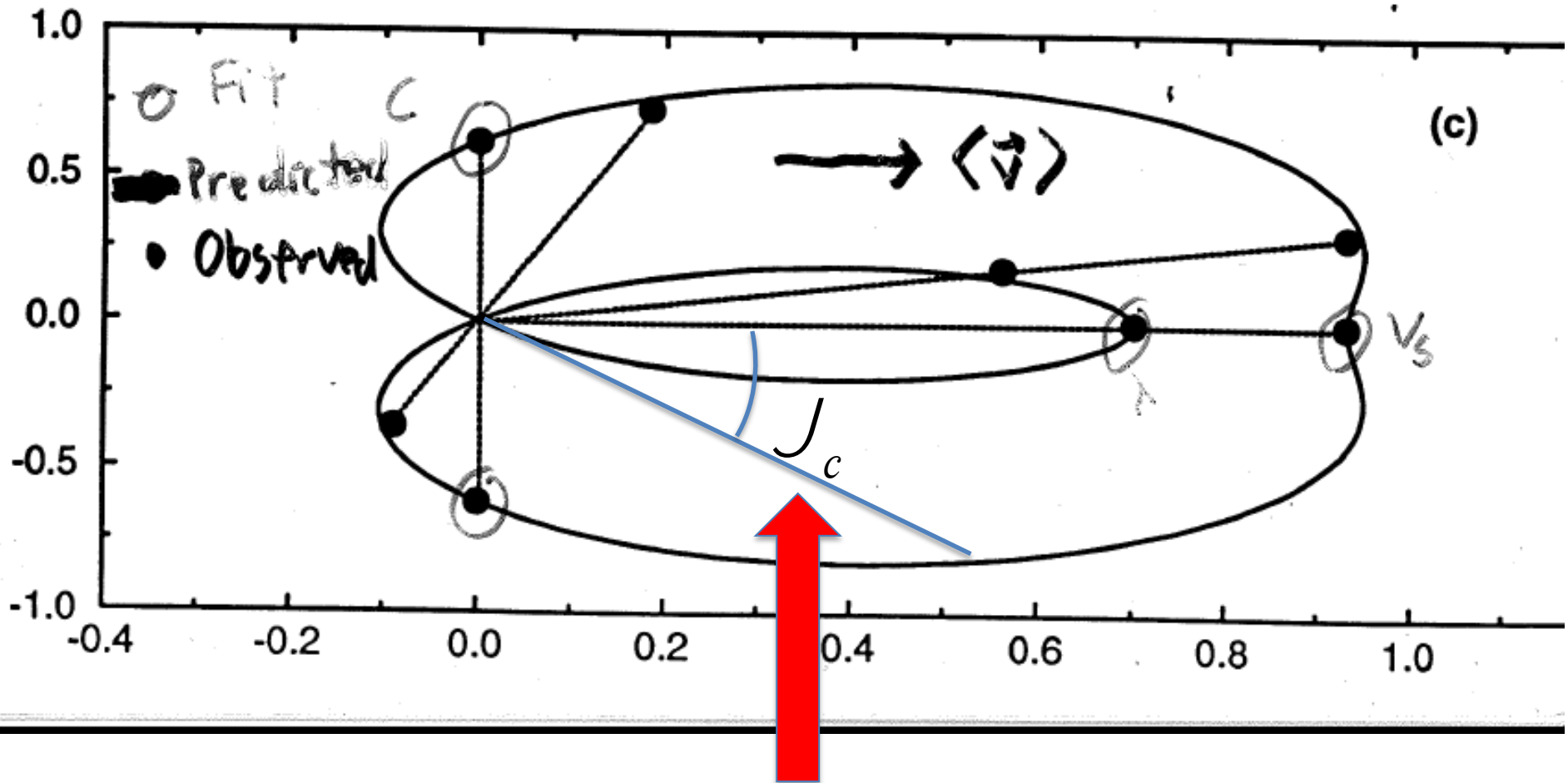
# What is the effect of quenched disorder **IN EQUILIBRIUM**?

- **HUGE**:  $d_{LC} = 4$  vs  $d_{LC} = 2$  for **annealed** disorder (see, e.g. Grinstein and Luther, 1979)
- => No LRO in  $d=2$  OR  $d=3$ !

# What is the effect of quenched disorder on **FLOCKS**?

- You might think: not much, because
- In co-moving frame of flock, disorder looks time dependent
- But: what matters is not how flock moves, but how sound moves (sound carries fluctuations)
- And some sound waves DON'T move!

# Polar plot of sound speeds:



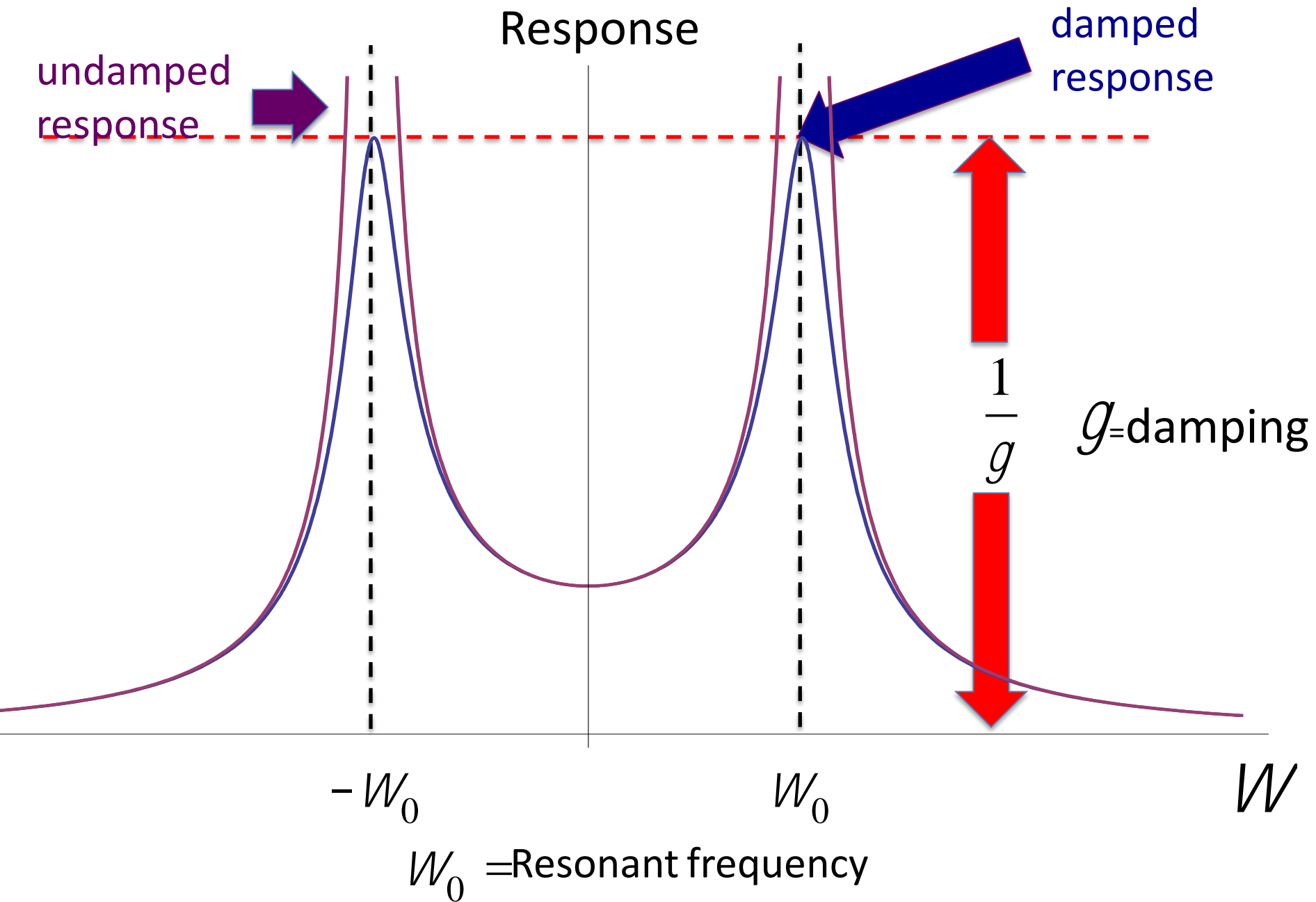
One sound speed **vanishes: crucial** for  
**quenched disorder problem**

# Analogy: forced, very underdamped oscillator

- Off resonance: response small, limited by spring constant of oscillator (independent of damping)

$$|Z(\omega)|^2 = \frac{1}{(\omega^2 - \omega_0^2)^2 + g^2 \omega^2}$$

- O  
n  
r





Driven underdamped  
oscillator

Flock with  
Quenched disorder

External driving force	$f$	Quenched disorder	$f_Q(\vec{r})$
Driving frequency	$W$	$W = \mathbf{0}$ (Disorder is static)	
Resonant frequency	$W_0$	$c_{1,2}(\mathcal{J})q$	
Damping	$g$	$Dq^2$	

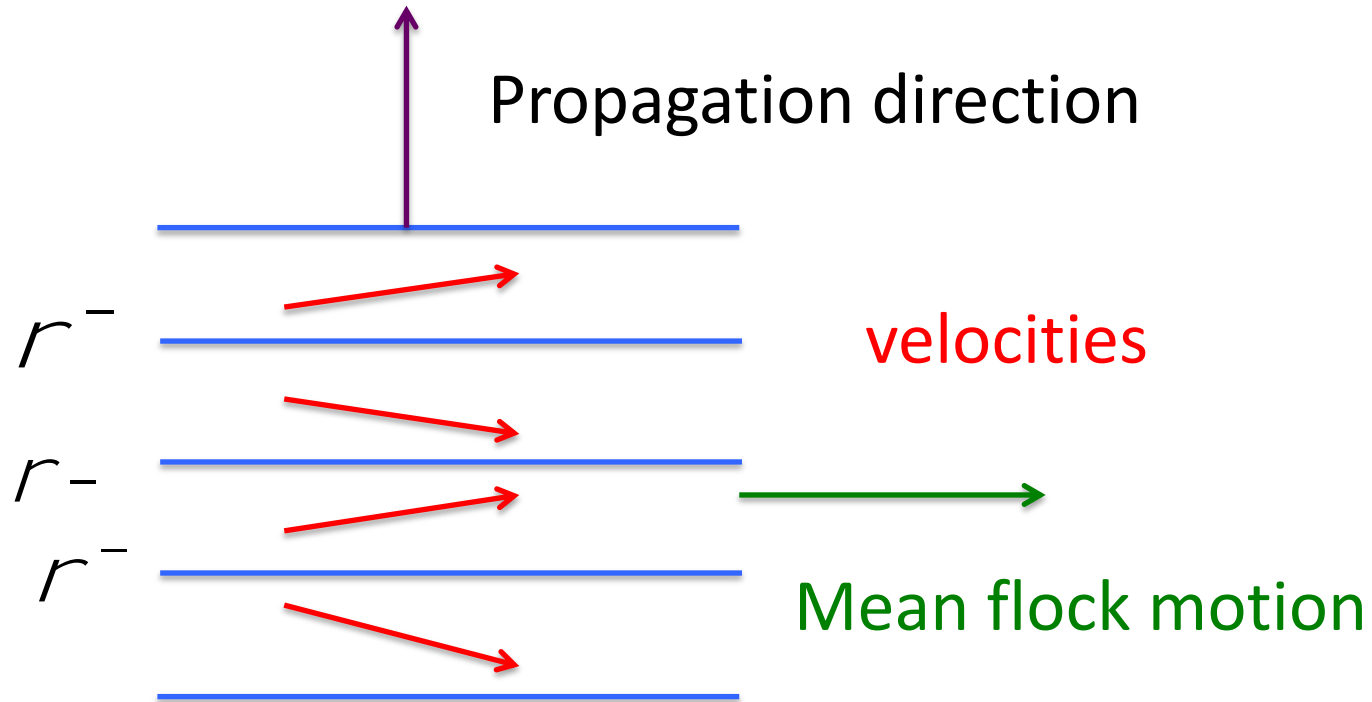
So, when  $c_{1,2}(\mathcal{J}) = 0$  quenched disorder  
is “on resonance” at  $W = 0$

=> Biggest fluctuations at  $\mathcal{J} = \pm \mathcal{J}_c \pm \rho$

One other weird wrinkle:  
fluctuations vanish at  $J = \pm \rho / 2$

Why?

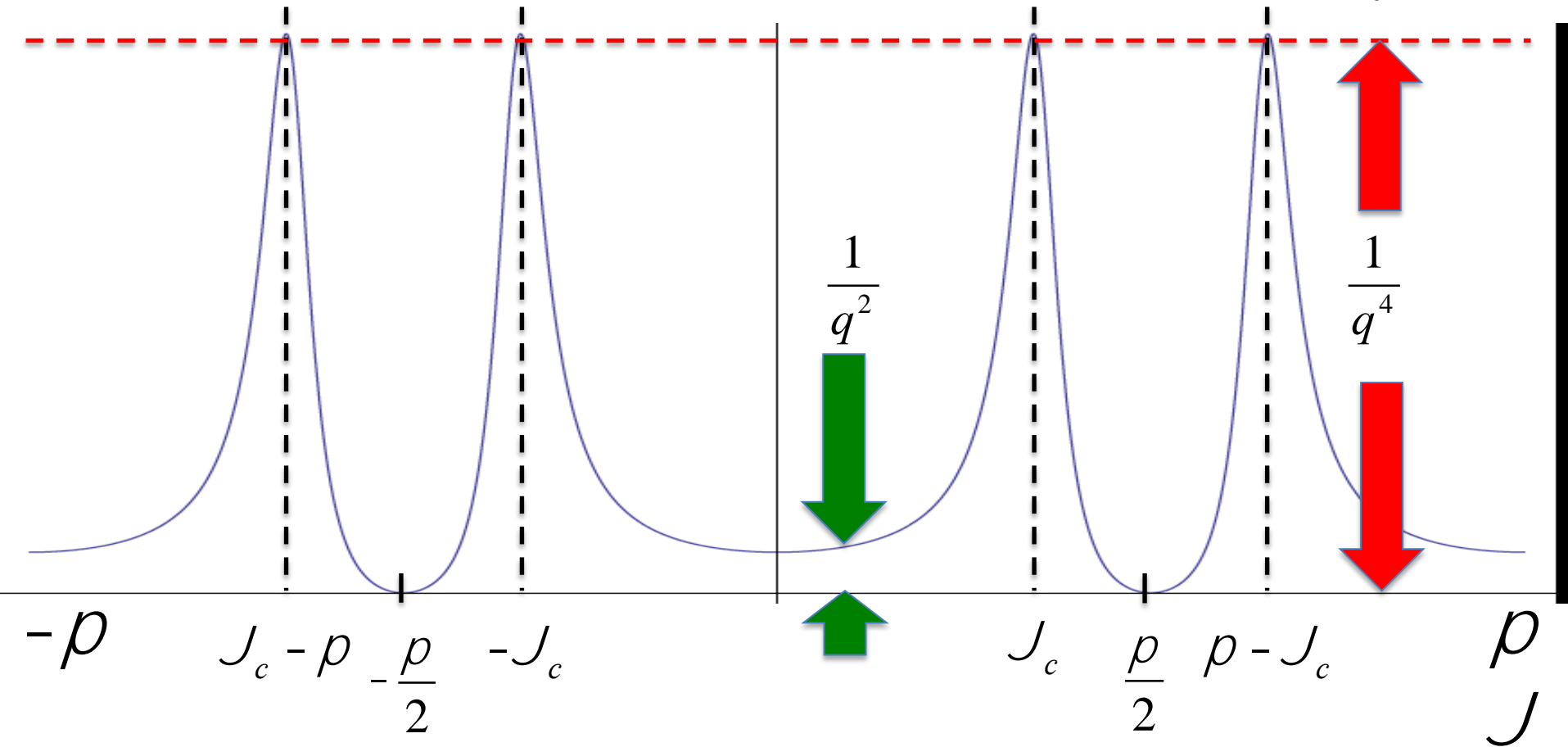
No convection  
To relieve  
Density buildup



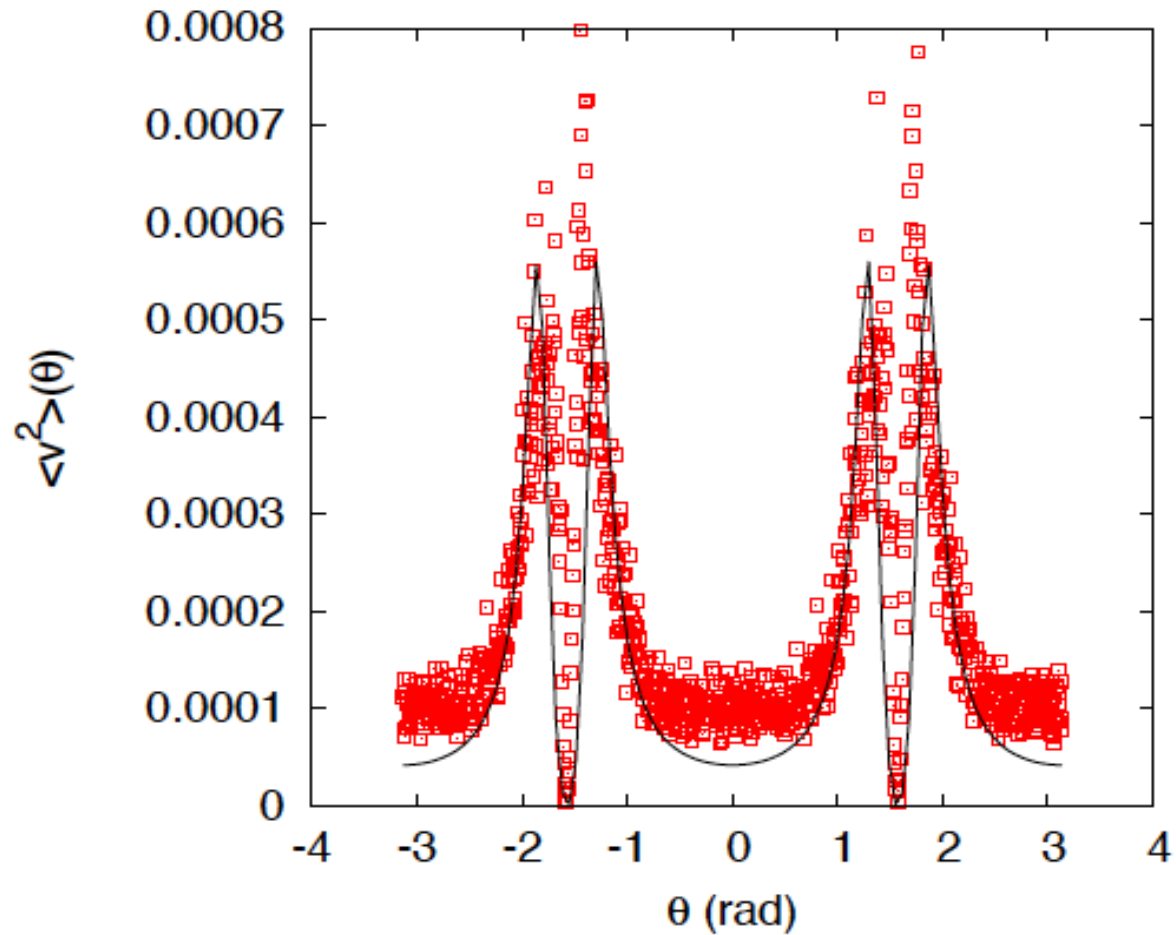
Pressure builds up, suppresses  
these fluctuations

# Summary of velocity fluctuations (Fourier space $\vec{q}$ )

$$\overline{|v(\vec{q})|^2} = \frac{\tilde{D} \cos^2 J}{q^2 [D^2 q^2 + (\sin^2 J - \tan^2 J_c \cos^2 J)^2]}$$



Result from “dead bird” simulation:



# Great, but....


- Plot looks the **SAME** for smaller  $q$ 's!
- What's happening?!
- **Anomalous Hydrodynamics  
(again!)**

# Anomalous Hydrodynamics (again!)

$$D_{eff}(q) \propto q^{(d-5)/3} \quad (\text{vs } D_{eff}(q) \propto q^{2(d-4)/5} \text{ for annealed problem})$$

$$\Rightarrow \text{in } d=2, \quad D_{eff}(q) \propto q^{-1}$$

$$\Rightarrow \overline{|v(\vec{q})|^2} = \frac{\tilde{D} \cos^2 J}{q^2 [D_{eff}^2(q) q^2 + (\sin^2 J - \tan^2 J_c \cos^2 J)^2]} \propto \frac{1}{q^2} \quad \begin{array}{l} \text{For} \\ \text{ALL} \\ J \\ \text{(Even } J = J_c) \end{array}$$

$$D_{eff}(q) = Aq^{-1}$$


- If noise is small, this coefficient will be small
- => Big peak at  $J_c$ , but q-independent
- EXACTLY what we see



Back to real space (d=2):

$$\overline{|v(\vec{q})|^2} \propto \frac{1}{q^2} \Rightarrow |\langle v(\vec{r}) \rangle| \propto L^{-h(D)}$$

$h(D)$  Non-universal exponent,  
grows as noise  $D$  grows

“Quasi-long-ranged order”

Exactly what's seen by Peruani et al  
in simulations of flocks with obstacles

d=3

$$D(q) \propto q^{(d-5)/3} = q^{-2/3}$$

Strong enough to  
Stabilize long-ranged order

$$\langle \vec{v}(\vec{r}) \rangle \neq \vec{0}$$

# Summary:

- Flocking is robust against quenched disorder,
- as well as annealed disorder
- Long ranged order in  $d=3$
- Quasi-long-ranged order  $d=2$
- Very detailed predictions of hydrodynamic
- theory verified by simulations (ours and others)



$$\begin{aligned}
& \partial_t \vec{v} + I_1 (\vec{v} \cdot \vec{\nabla}) \vec{v} + I_2 \vec{v} (\vec{\nabla} \cdot \vec{v}) + I_3 \vec{\nabla} |\vec{v}|^2 = a \vec{v} - b |\vec{v}|^2 \vec{v} \\
& - \vec{\nabla} P(r) - \vec{v} (\vec{v} \cdot \vec{\nabla} P_2(r)) + D_B \vec{\nabla} (\vec{\nabla} \cdot \vec{v}) + D_T \nabla^2 \vec{v} + D_2 (\vec{v} \cdot \vec{\nabla})^2 \vec{v} \\
& + f_Q(\vec{r})
\end{aligned}$$