

Collective movement and the evolution of cooperation

Vishwesh Guttal
Centre for Ecological Sciences
Indian Institute of Science

Bangalore School on Population Genetics and Evolution

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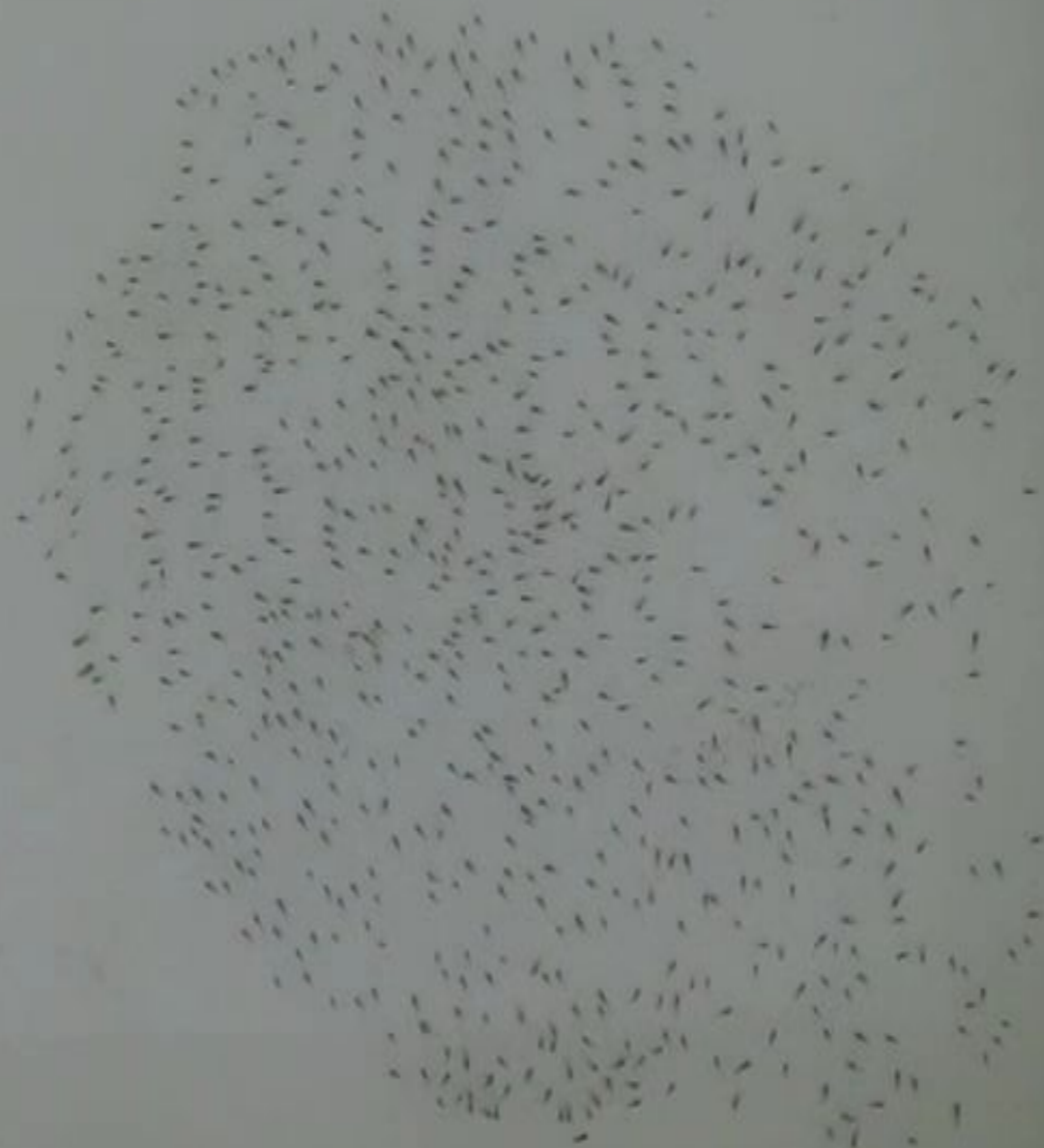




Image: Ingo Arndt

Self-organization:
Simple
math/computational
models of collective
movement

Inverse problem:
Given real data, can we
construct the model?

Evolutionary problem:
Why do organisms show
collective movement?

Acknowledgements

- **Funding**

- DBT-IISc Partnership Program, CSIR, DBT Ramalingaswamy Fellowship
- DST-Mathematical Biology Phase II

- **Collaborators**

- Students: Jaideep Joshi (Phd Student)
- Simon Levin, Iain Couzin



The dilemma of cooperation

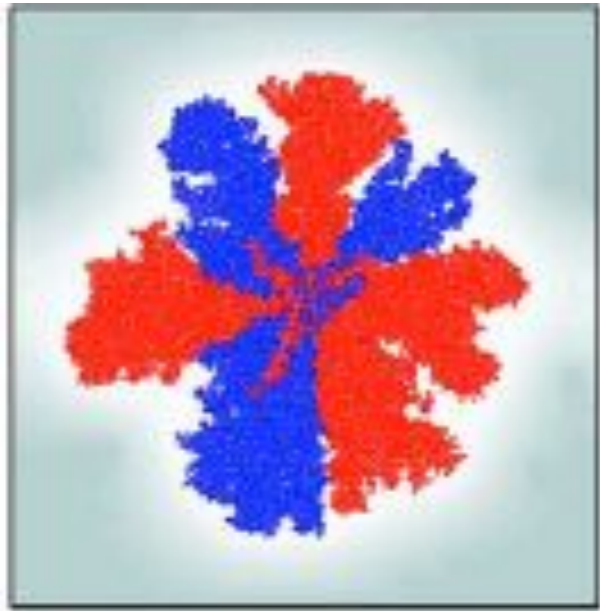
- Cooperation - an action to benefit (b) others at a cost (c) to himself/herself
- Cooperation (C) evolutionarily unstable to invasion by defectors/cheaters (D)

- Pay-offs (w) in a game theoretic framework:

- D is the Nash-equilibria.
- C is unstable

		C	D
C		$b - c$	$-c$
D		b	0

A solution: spatial assortment



Nadell et al 2010

- If cooperators (red) are spatially assorted, then
 - $w(C) > w(D)$, where w stands for average pay-offs
- Mobility destroys spatial assortment
- We challenge this common assumption
 - Result: Cooperation + Grouping can coevolve in mobile populations, yet maintain assortment

Computational model

- Individual-based (N) & spatially-explicit (two dimensional continuous)
- Each (mobile) individual can have **two costly traits**: Flock (0,1) / Cooperation (0,1)

Simulations of active system

Active Particles

$$R_s = 0$$

Simulations of passive system

Particles in turbulent
Medium

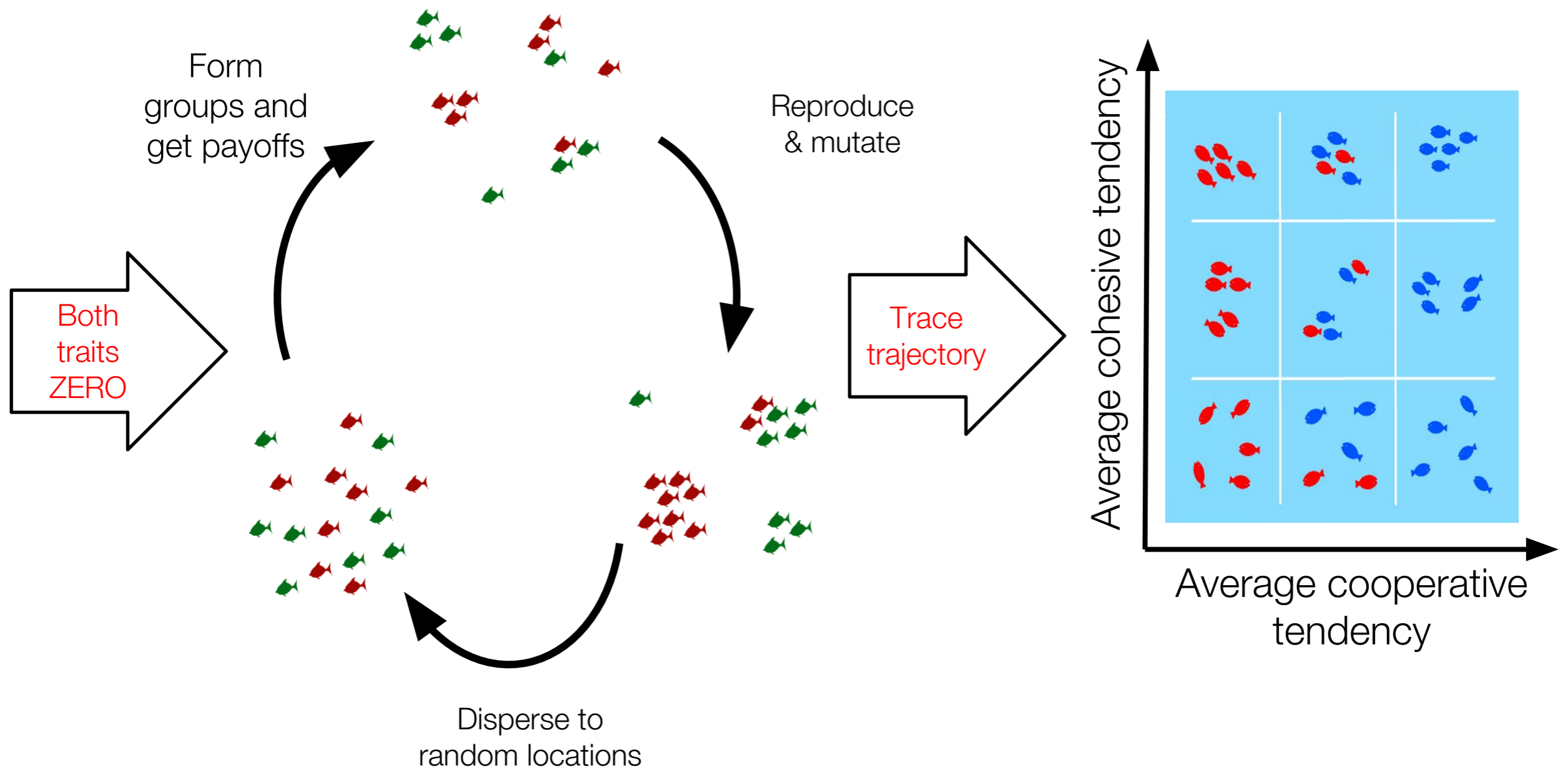
Stickiness = 0.1

Computational model

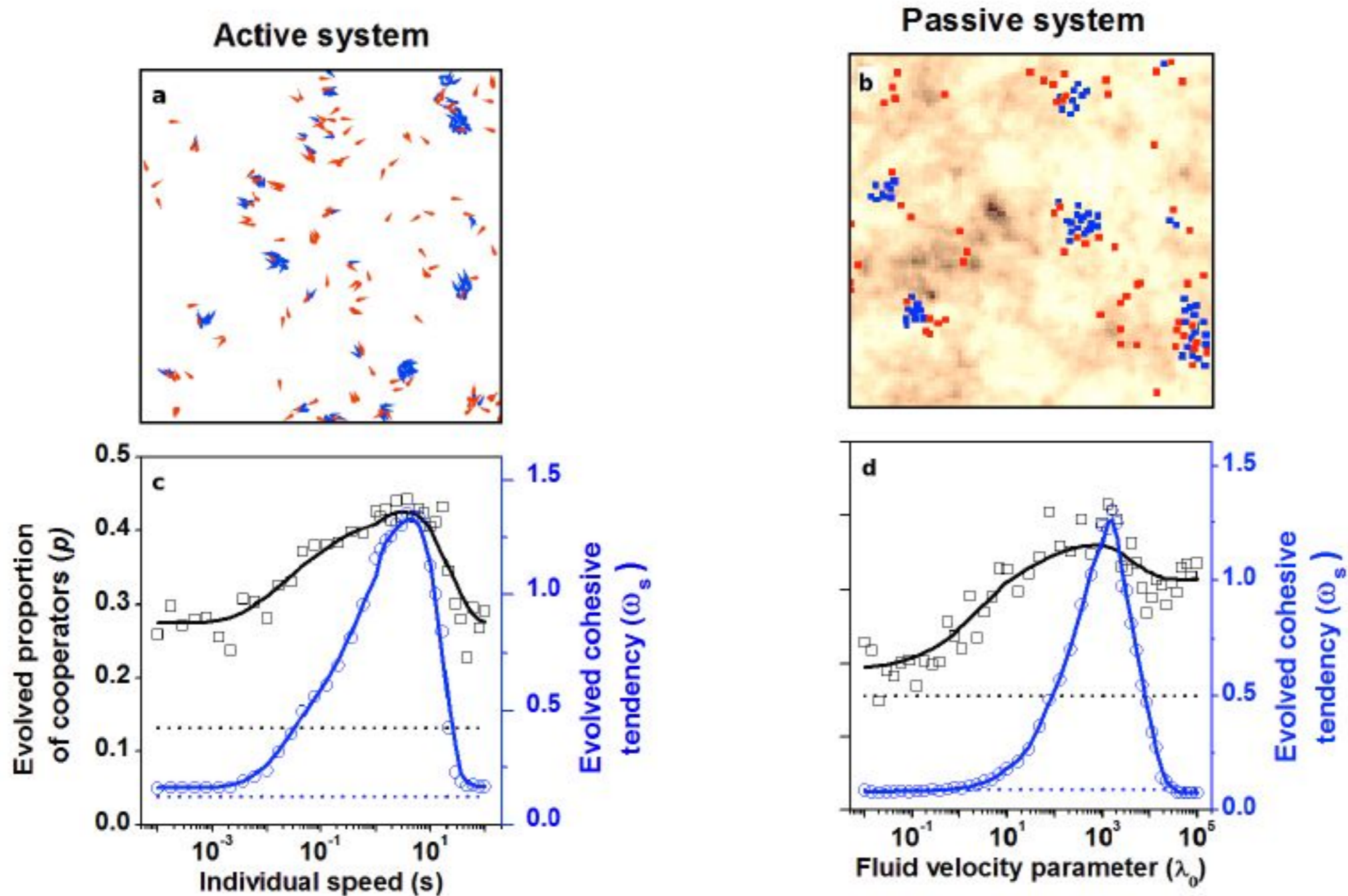
- Individual-based (N) & spatially-explicit (two dimensional continuous)
- Each (mobile) individual can have **two costly traits**: Flock (0,1) / Cooperation (0,1)
- **Four trait combinations** – more complicated pay-off matrix
 - Solitary Defectors (0, 0) [Least costly]
 - Solitary Cooperators (0,1) [Intermediate cost]
 - Flocking Defectors (1,0) [Intermediate cost]
 - Flocking Cooperators (1,1) [Costliest trait combination, but potential for high benefits]
- **In well-mixed populations**: Solitary defector is evolutionarily stable strategy

Trace evolutionary trajectory

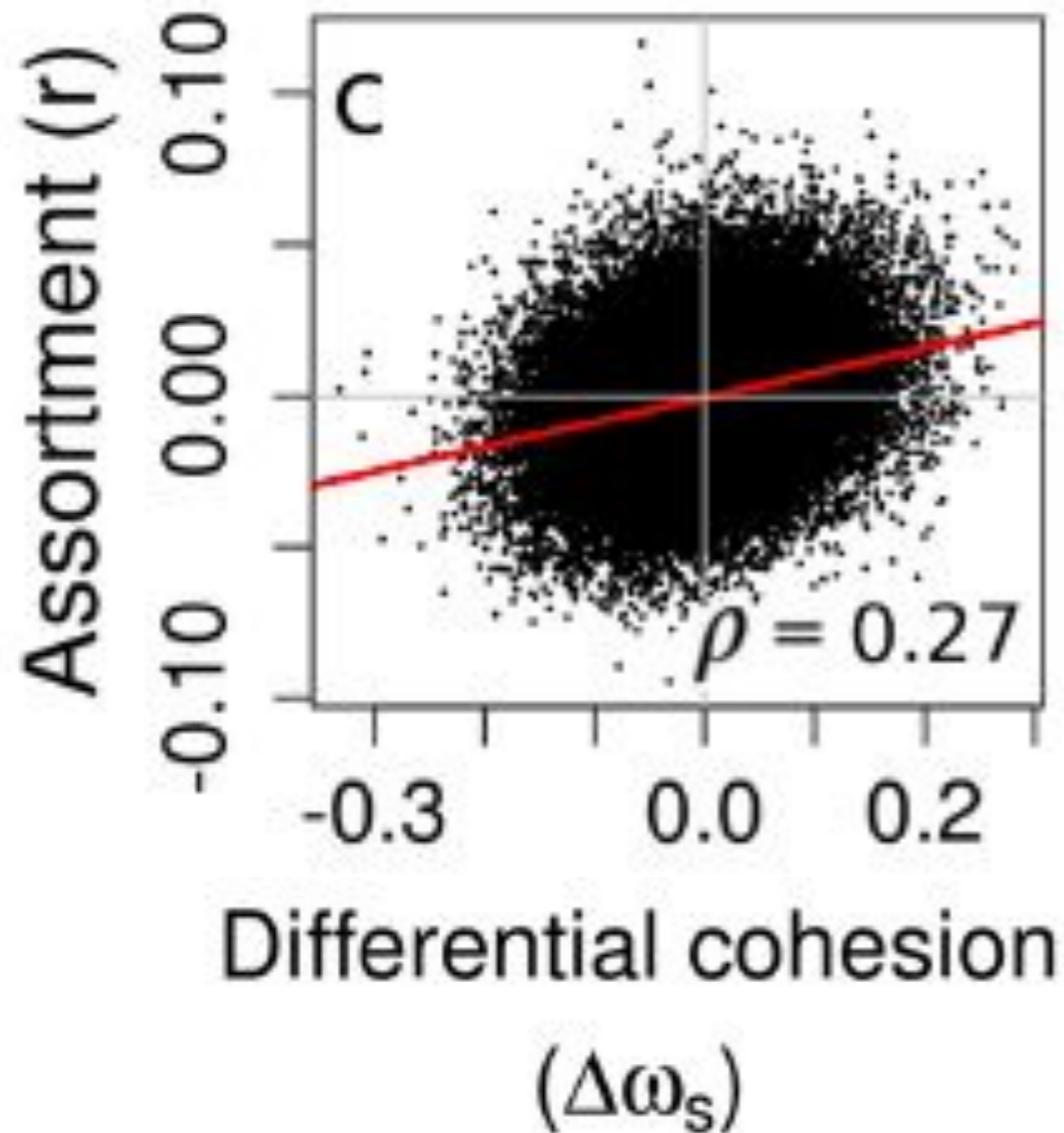
Simulate group formation, reproduction, mutation and dispersal



Emergence of flocking and cooperation in mobile populations



Assortment via differential adhesion

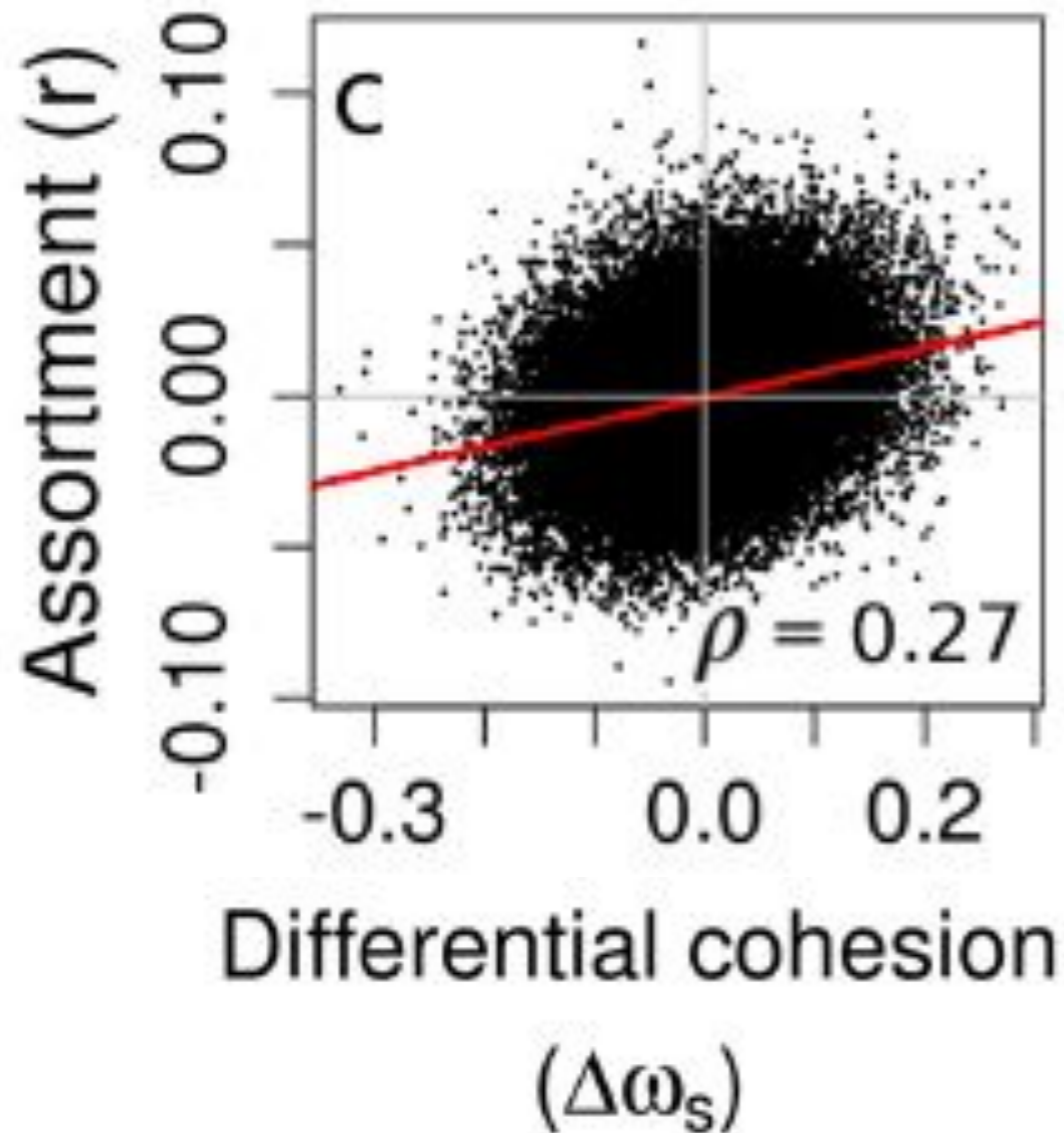


Active particles

$$R_{sC} = 3$$

$$R_{sD} = 3$$

Assortment via differential adhesion



Particles in turbulent
Medium

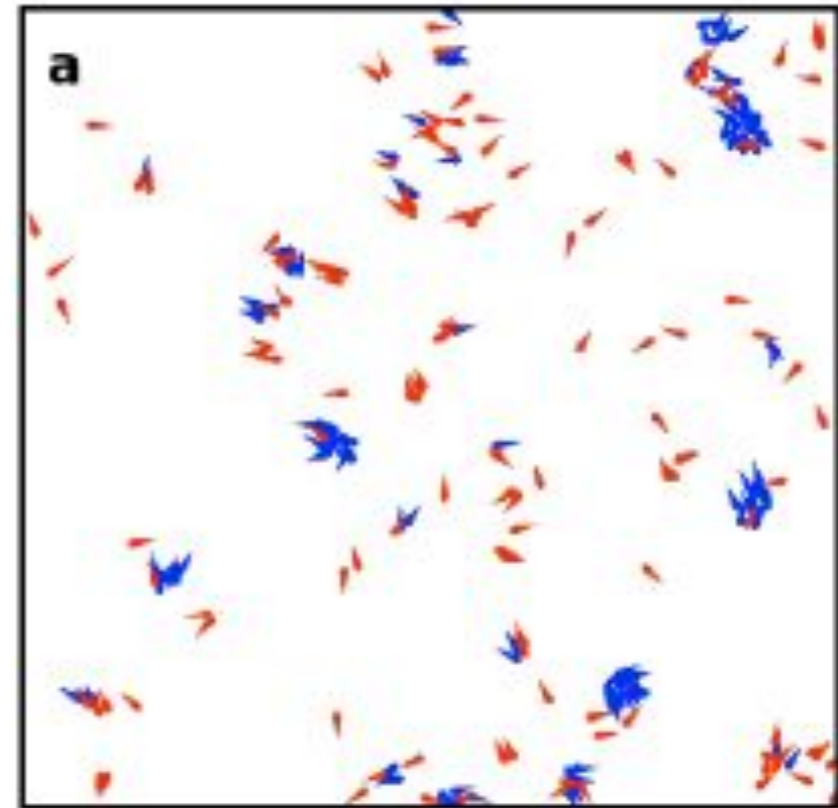
$$\gamma_C = 0.4$$

$$\gamma_D = 0.4$$

Multi-level selection interpretation

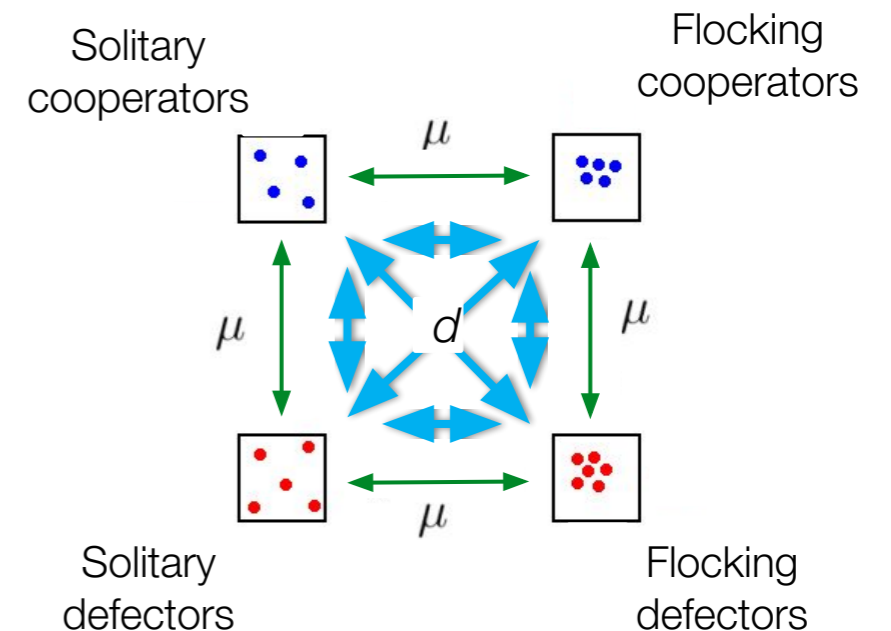
- ‘Within-group’ selection against cooperation.
- Between group selection for cooperations.
- Consistent with inclusive fitness interpretation

Active system




Analytical model

- Consider sub-populations and compute their average pay-offs
 - Flocking cooperators (p_f);
 - Solitary cooperators (p_s);
 - Total flocking individuals (q)
 - Total cooperators (p)
- Assume all groups of same size, well mixing within groups, etc.
- **Stochastic coupled replicator equations**, via Master & Fokker-Planck equations, accounting for stochasticity in transitions between different states



Analytical mutation-selection-drift model



x
 y
 z
 w


$$\begin{aligned}
 \begin{bmatrix} dp_t \\ dp_s \\ dq \end{bmatrix} &= \frac{d}{V_0} \begin{bmatrix} -(c + \frac{b}{qN})p_t(1-p_t) \\ -cp_s(1-p_s) \\ q(1-q)(p_t(b - \frac{b}{qN} - c) + cp_s - c_s) \end{bmatrix} dt \quad \text{Selection} \\
 &+ \mu \begin{bmatrix} 1 - 2p_t + \frac{1-q}{q}(p_s - p_t)(1 - \frac{1}{qN}) \\ 1 - 2p_s + \frac{q}{1-q}(p_t - p_s)(1 - \frac{1}{(1-q)N}) \\ 1 - 2q \end{bmatrix} dt \\
 &+ \sqrt{\frac{1}{N}} \begin{bmatrix} 0 & \frac{1-p_t}{q} & 0 & -\frac{p_t}{q} \\ \frac{1-p_s}{1-q} & 0 & -\frac{p_s}{1-q} & 0 \\ 0 & 1 & 0 & 1 \end{bmatrix} \begin{bmatrix} \\ \\ \\ G \end{bmatrix} dW
 \end{aligned}$$

Analytical mutation-selection-drift model

x
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$$\begin{aligned}
 \begin{bmatrix} dp_t \\ dp_s \\ dq \end{bmatrix} &= \frac{d}{V_0} \begin{bmatrix} -(c + \frac{b}{qN})p_t(1 - p_t) \\ -cp_s(1 - p_s) \\ q(1 - q)(p_t(b - \frac{b}{qN} - c) + cp_s - c_s) \end{bmatrix} dt \\
 &+ \mu \begin{bmatrix} 1 - 2p_t + \frac{1-q}{q}(p_s - p_t)(1 - \frac{1}{qN}) \\ 1 - 2p_s + \frac{q}{1-q}(p_t - p_s)(1 - \frac{1}{(1-q)N}) \\ 1 - 2q \end{bmatrix} dt \quad \text{Mutation} \\
 &+ \sqrt{\frac{1}{N}} \begin{bmatrix} 0 & \frac{1-p_t}{q} & 0 & -\frac{p_t}{q} \\ \frac{1-p_s}{1-q} & 0 & -\frac{p_s}{1-q} & 0 \\ 0 & 1 & 0 & 1 \end{bmatrix} \begin{bmatrix} G \\ G \\ G \\ G \end{bmatrix} dW
 \end{aligned}$$

Analytical mutation-selection-drift model



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 \end{aligned}$$

Drift

Simplified equation for cooperation

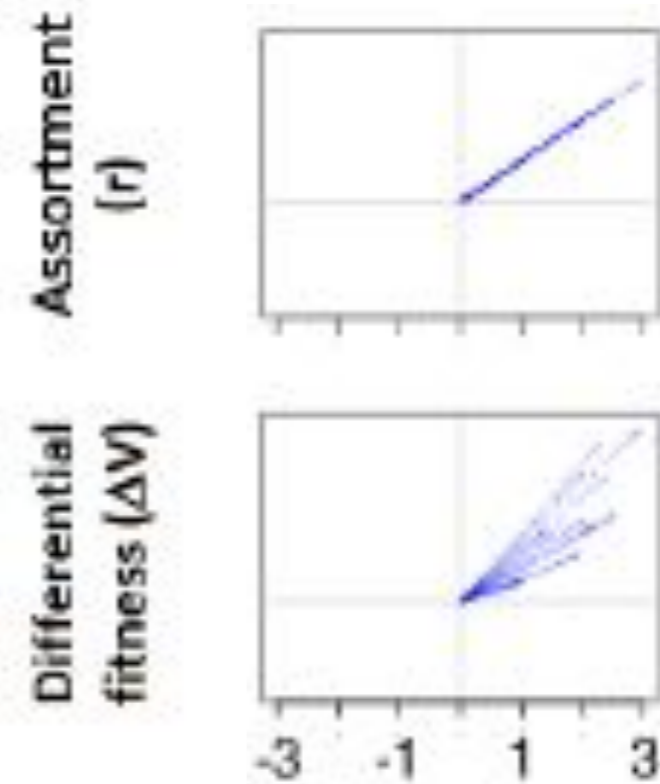
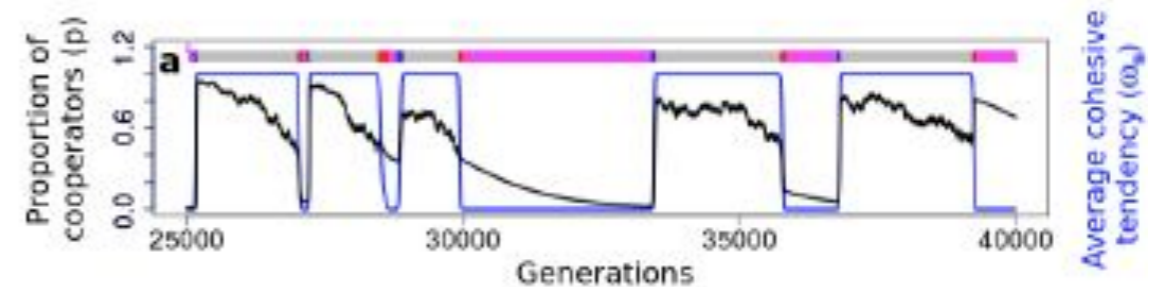
$$\frac{dp}{dt} = p(1-p)(rb_{\text{eff}} - c_{\text{eff}}) + \text{noise terms}$$

Condition for cooperation to evolve: r

$$b_{\text{eff}} - c_{\text{eff}} > 0$$

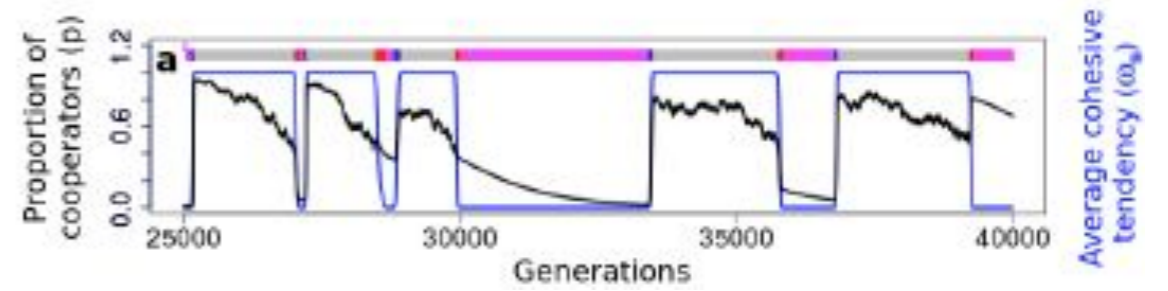
- r is a measure of assortment
- $r = \Delta\omega =$ difference in flocking tendency of cooperators and defectors (or differential cohesion, in short)

There is no steady-state; but predicts a cycling of various trait combinations



Differential cohesive tendency ($\Delta\omega_s$)

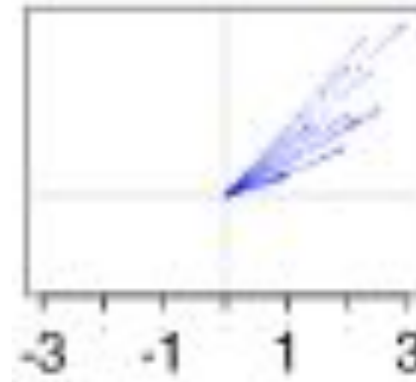
Analytical model predictions



Assortment
(r)

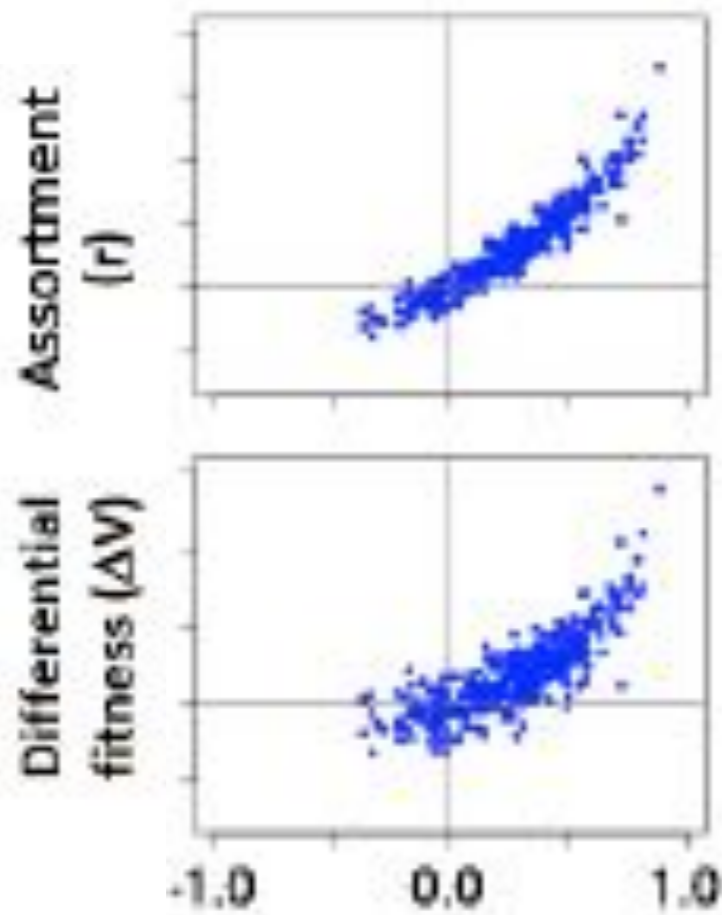
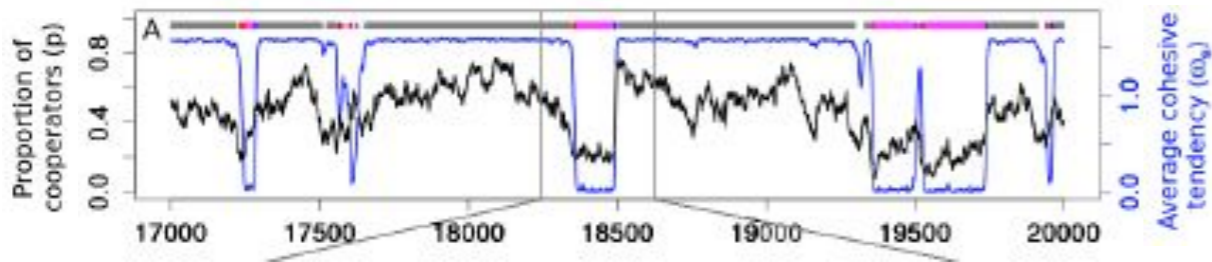


Differential
fitness (ΔV)



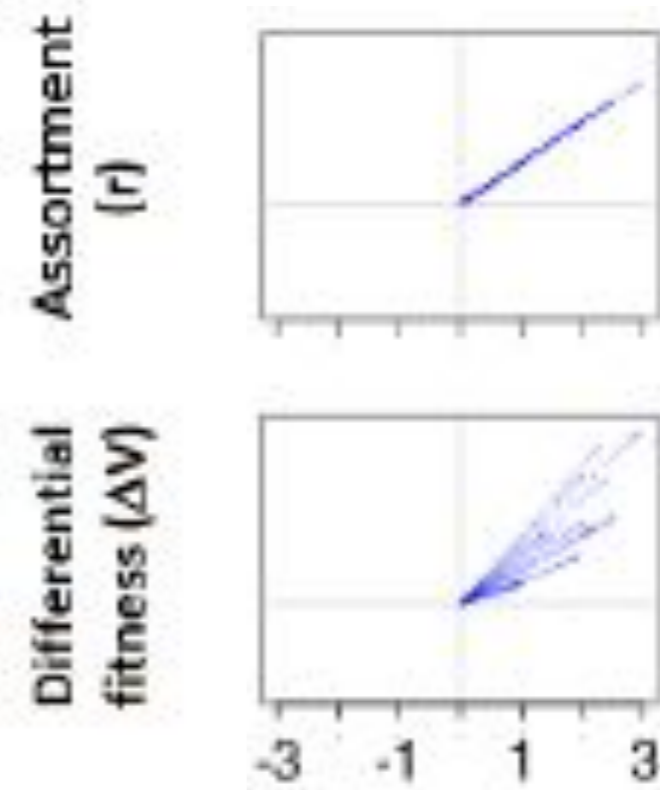
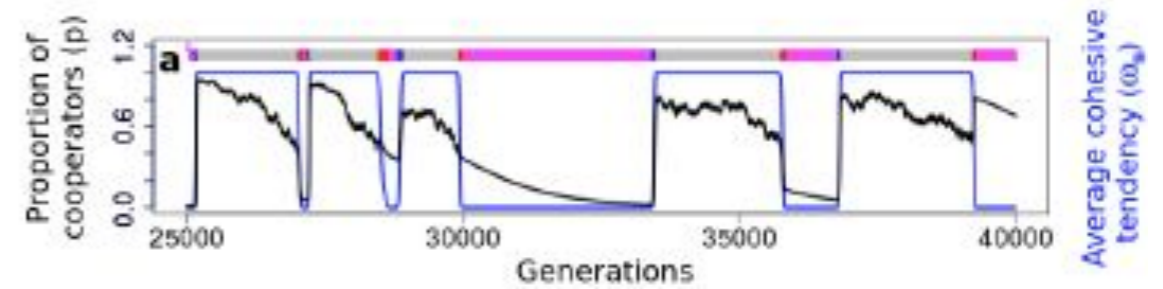
Differential cohesive tendency ($\Delta\omega_c$)

Computational model simulations



Differential cohesive tendency ($\Delta\omega_c$)

Analytical model predictions

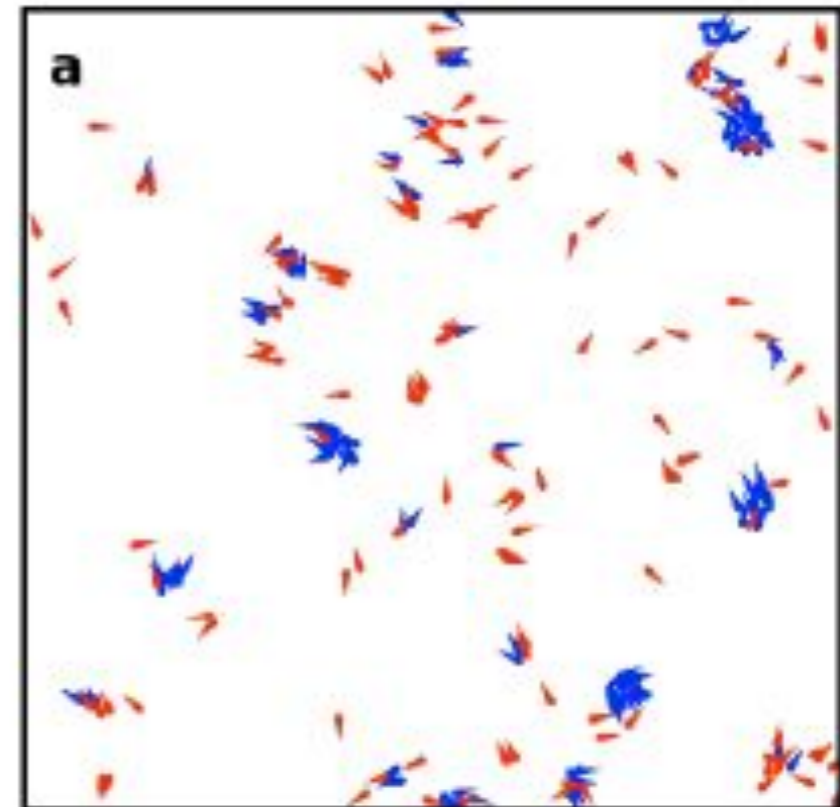


Differential cohesive tendency ($\Delta\omega_c$)

Summary

- Mobility can promote cooperation
- Despite mixing between mobile groups, cooperators assort by evolving relatively stronger flocking tendencies
- Individual based spatial model & analytically derived SDE model results qualitatively agree.

Active system



$$r b_{\text{eff}} - c_{\text{eff}} > 0$$

where r = cohesion of cooperators
- cohesion of defectors

RESEARCH ARTICLE

Mobility can promote the evolution of cooperation via emergent self-assortment dynamics

Jaideep Joshi^{1*}, Iain D Couzin^{2,3}, Simon A Levin⁴, Vishwesh Guttal^{1*}

1 Centre for Ecological Sciences, Indian Institute of Science, Bengaluru, India, **2** Department of Collective Behaviour, Max Planck Institute for Ornithology, Konstanz, Germany, **3** Chair of Biodiversity and Collective Behaviour, Department of Biology, University of Konstanz, Konstanz, Germany, **4** Department of Ecology and Evolutionary Biology, Princeton University, Princeton, New Jersey, United States of America

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