

## 'Spatio-temporal patterns in ecology'



Spatial patterns in phytoplankton Lotte Sewalt



Pattern-formation in Semiarid Vegetation Sarah lams



Stripe Patterns in Vegetation Eric Siero



Patterns in Musselbeds



#### Patterns in animal communities

Coherent spatial patterns in animal communities are found

Our model ecosystem: mussel beds





Patterns do not arise from activation/inhibition or chemotaxis

## **Laboratory experiments**



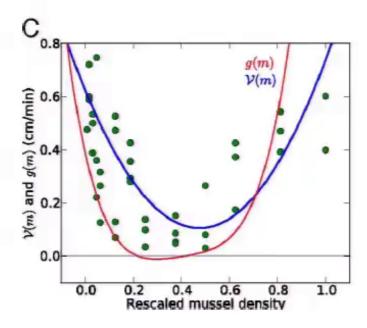
#### Similar patterns are observed in the lab



from Van de Koppel et al. (Science 2008)



Photo Aniek van der Berg



Movement speed of mussels depends on the local density













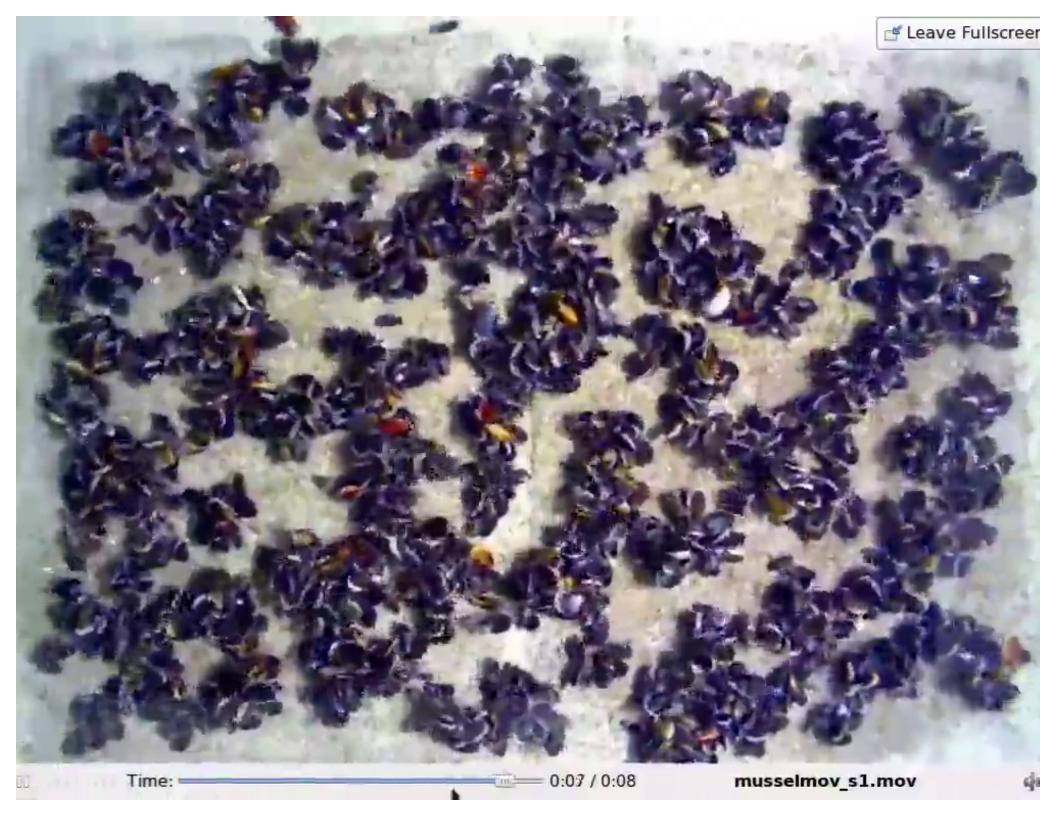


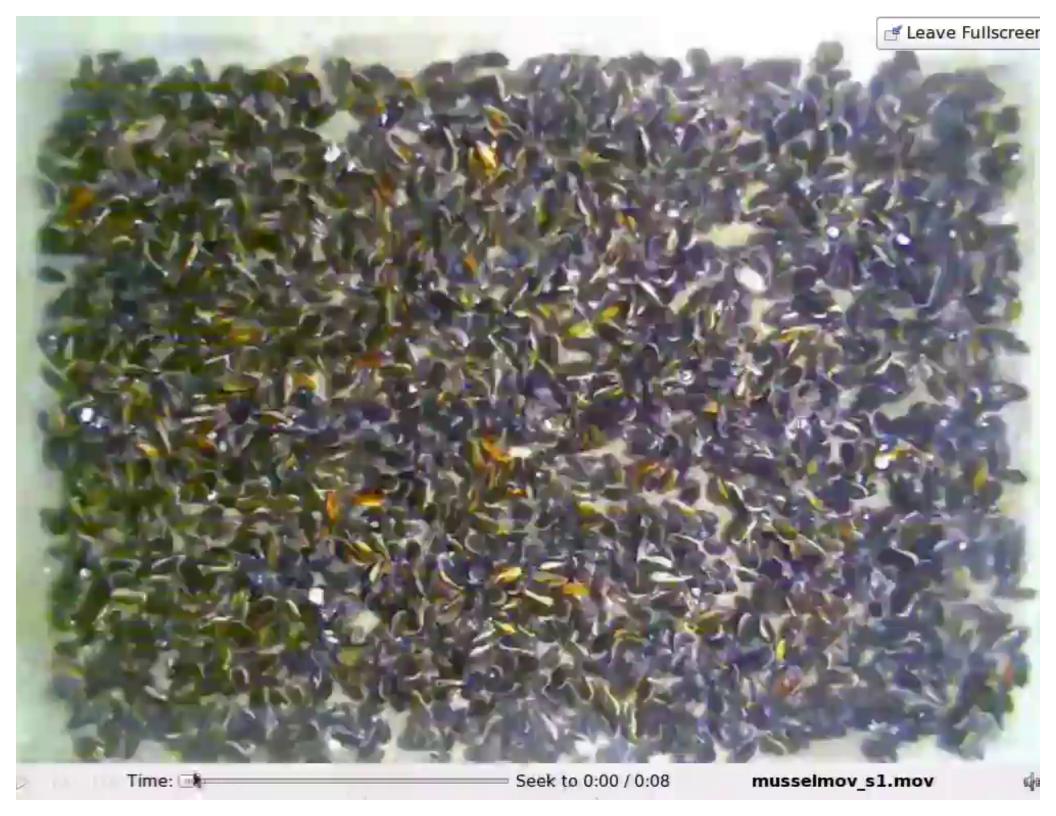




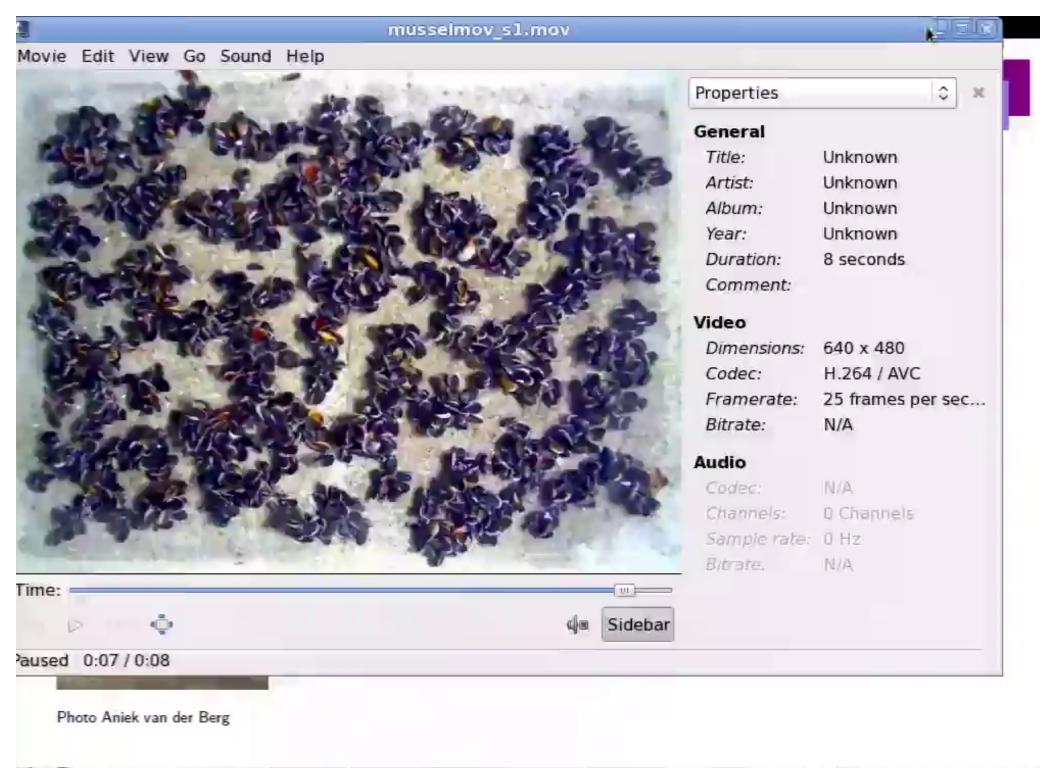












































## **Laboratory experiments**



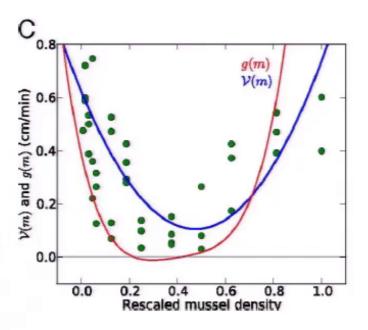
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Movement speed of mussels depends on the local density

#### Aim: derive model



Based on density-dependent movement derive model

m(x,t) local density of mussels; v(m) speed of mussels

Mussel pattern formation is a fast process: independent of birth or death

So, total mass of mussels conserved

$$\int_{domain} m(s,t) ds = \int_{domain} m(s,0) ds = \text{ constant}$$

and, generic conservation equation is satisfied

$$\frac{\partial m}{\partial t} = -\nabla \cdot J = -\nabla \cdot (J_v + J_{nl})$$

J net flux of mussels

 $J_v$  flux related to speed v

 $J_{nl}$  flux related to nonlocal interactions

#### The model



Population of organisms performing random walk in 2 dimensions with speed v(m) and turning rate  $\tau(m)$  [Schnitzer]

$$J_{v} = -\frac{v(m)}{2\tau(m)} \nabla \left(v(m)m\right)$$

Long range interactions

$$J_{nl} = \kappa \nabla(\Delta m)$$

for some  $\kappa > 0$ 

Then

$$\frac{\partial m}{\partial t} = \nabla \left[ f(m) \nabla m - \kappa \nabla (\Delta m) \right],$$

with

$$f(m) = \frac{v}{2\tau} \left( v + m \frac{dv}{dm} \right)$$



### Surprise: a Cahn-Hilliard equation



The model can be written as the Cahn-Hilliard equation

$$\frac{\partial m}{\partial t} = \nabla^2 \left[ F(m) - \kappa \nabla^2 m \right], \text{ for some } \kappa > 0$$

with

$$F'(m) = f(m) = \frac{v}{2\tau} \left( v + m \frac{dv}{dm} \right)$$

The CH was proposed in 1958 to model phase separation in binary alloys

#### Phase separation



The Cahn-Hilliard equation  $\frac{\partial m}{\partial t} = \nabla^2 \left[ F(m) - \kappa \nabla^2 m \right]$ was proposed in 1958 to model phase separation in binary alloys

CH can be derived from energy functional

$$E(m) = \int_{\Omega} F(m) + \frac{1}{2} \kappa |\nabla m|^2 dx$$

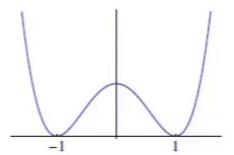
In the standard setting, W(m) is a symmetric double-well potential (W' = F)In standard setting, W(m) is a

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potential 
$$(W' = F)$$

$$\text{potential} \ \, \big(W'=F\big) \\ W(m) = \frac{1}{4}(m^2-1)^2,$$

$$F(m) = W'(m) = m^3 - m.$$



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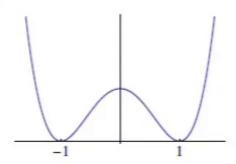
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 $W(m) = \frac{1}{4}(m^2 - 1)^2$ ,

$$F(m) = W'(m) = m^3 - m.$$





Generates patterns consisting of

2 phases 
$$m_+ = +1$$
 and  $m_- = -1$   
= minima of  $W(m)$  ( $W' = F$ )

More general: CH-type patterns are formed when W has 2 minima

#### Back to mussels



In mussels the CH equation does not come from energy conservation

$$\frac{\partial m}{\partial t} = \nabla^2 \left[ F(m) - \kappa \nabla^2 m \right],$$

with

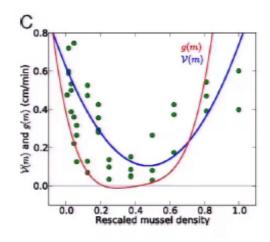
$$F'(m) = f(m) = \frac{v}{2\tau} \left( v + m \frac{dv}{dm} \right) = W''(m)$$

Patterns when f has **one negative minimum** 

Fit data:

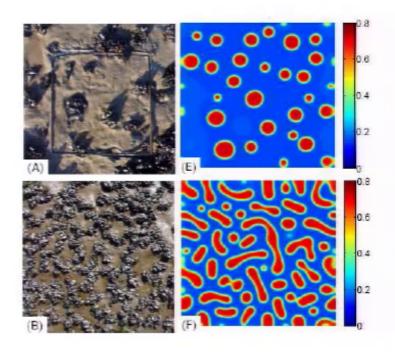
$$v(m) = am^2 + bm + c,$$

a, b and c can be obtained from data



## Comparison

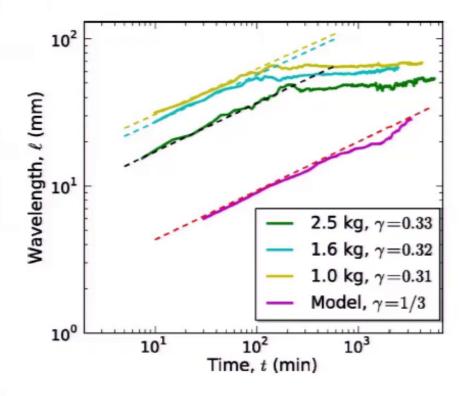




Increasing total mass of mussels in domain

**Coarsening**: wavelength of pattern grows in time

Experiments versus model





#### Discussion



# NAS

## Phase separation explains a new class of selforganized spatial patterns in ecological systems

Quan-Xing Liu<sup>a,b,1</sup>, Arjen Doelman<sup>c</sup>, Vivi Rottschäfer<sup>c</sup>, Monique de Jager<sup>a</sup>, Peter M. J. Herman<sup>a</sup>, Max Rietkerk<sup>d</sup>, and Johan van de Koppel<sup>a,e</sup>

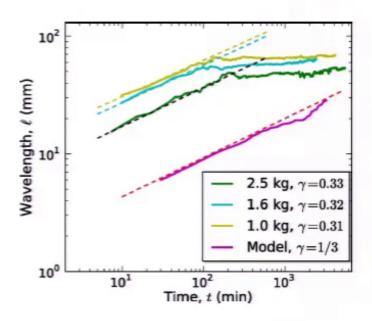
<sup>a</sup>Department of Spatial Ecology, Royal Netherlands Institute for Sea Research, 4400 AC Yerseke, The Netherlands; <sup>b</sup>Aquatic Microbiology, Institute for Biodiversity and Ecosystem Dynamics, University of Amsterdam, 1090 GE Amsterdam, The Netherlands; <sup>c</sup>Mathematical Institute, Leiden University, 2300 RA Leiden, The Netherlands; <sup>d</sup>Department of Environmental Sciences, Copernicus Institute, Utrecht University, 3508 TC Utrecht, The Netherlands; and <sup>c</sup>Community and Conservation Ecology Group, Centre for Ecological and Evolutionary Studies, University of Groningen, 9700 CC Groningen, The Netherlands

Model can also be used for other animal populations;
 density dependent movement also observed in grazing herds (elk)

## **Future/Discussion**



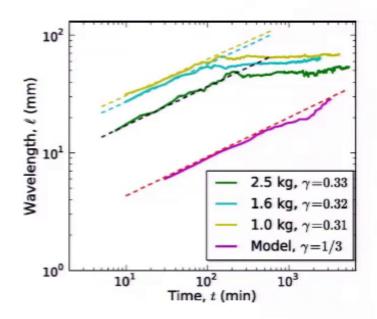
- Long term dynamics (Turing patterns): add growth and mortality
- Couple to variation and availability of food resources



## **Future/Discussion**



- Long term dynamics (Turing patterns): add growth and mortality
- Couple to variation and availability of food resources





 Model assumes Brownian motion but animals perform a Lévy walk when their density is low

