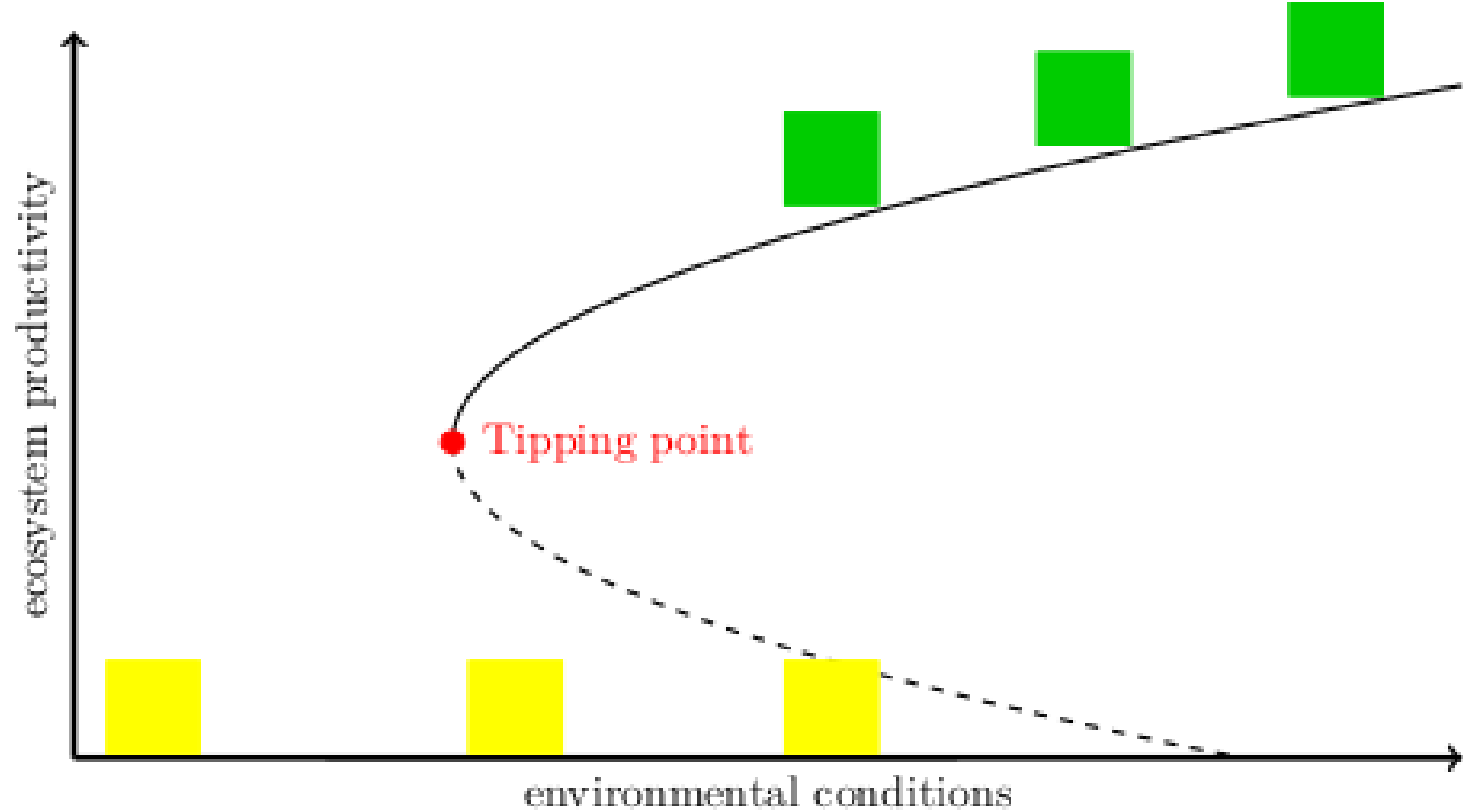
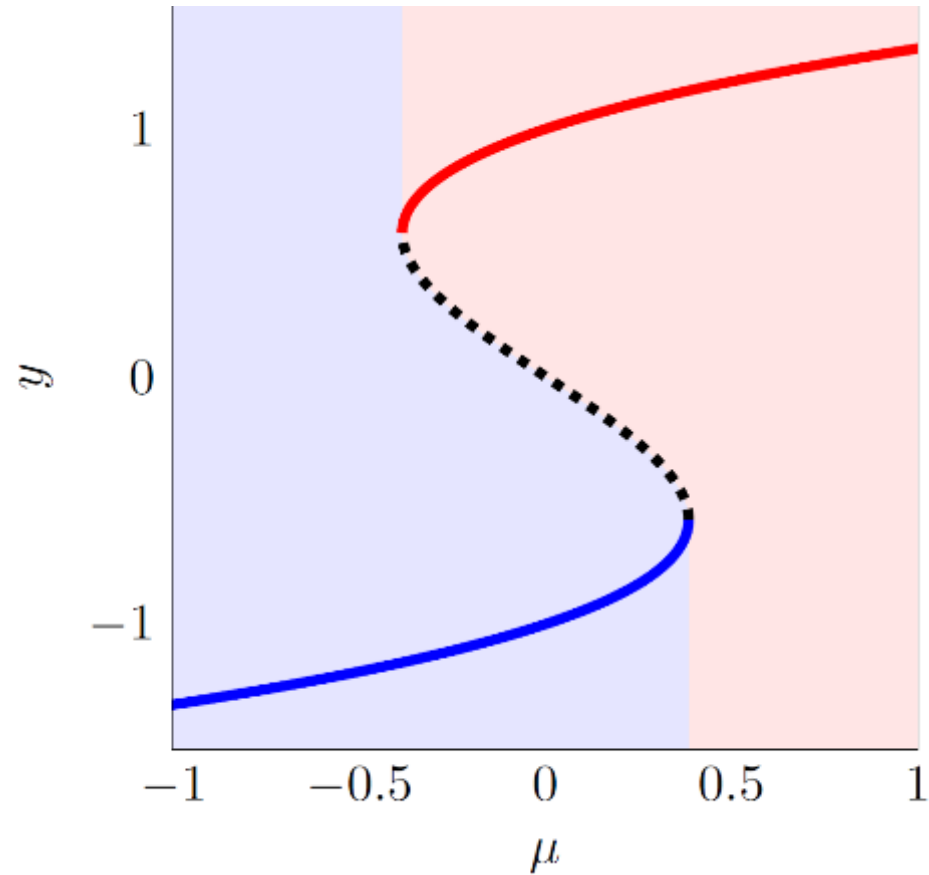


# Tipping in Spatially Extended Systems

2022-07-20, Tipping Seminar, Munich  
Robbin Bastiaansen (r.bastiaansen@uu.nl)



# Classic Theory of Tipping



**Canonical example:**

$$\frac{dy}{dt} = y(1 - y^2) + \mu$$

$$\frac{d\vec{y}}{dt} = f(\vec{y}; \mu)$$

$$\begin{cases} \frac{du}{dt} = f(u, v; \mu) \\ \frac{dv}{dt} = g(u, v; \mu) \end{cases}$$





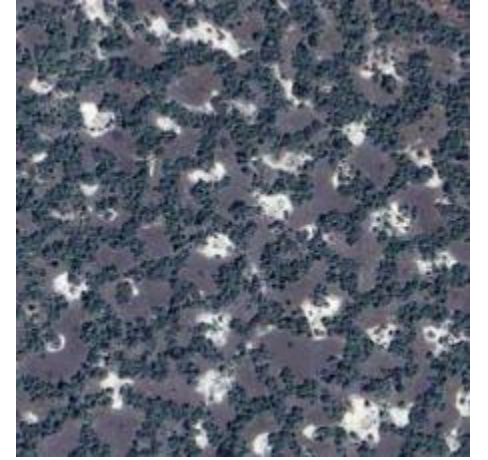
# Examples of spatial patterning – regular patterns



mussel beds



clouds



savannas



melt ponds



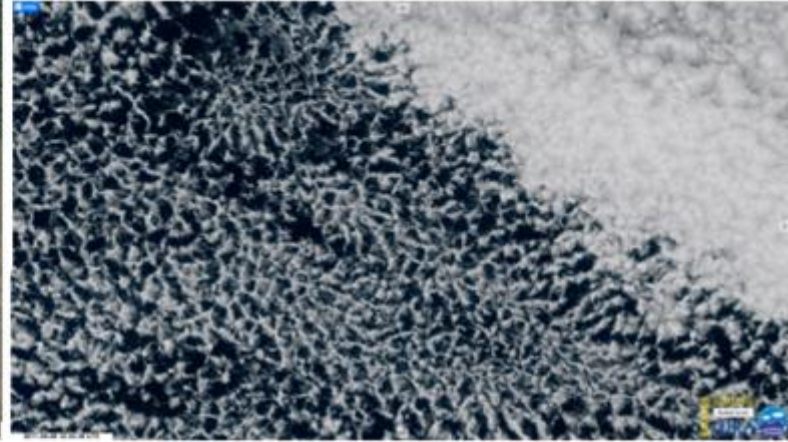
drylands



# Examples of spatial patterning – spatial interfaces

tropical forest  
& savanna  
ecosystems

[Google Earth]

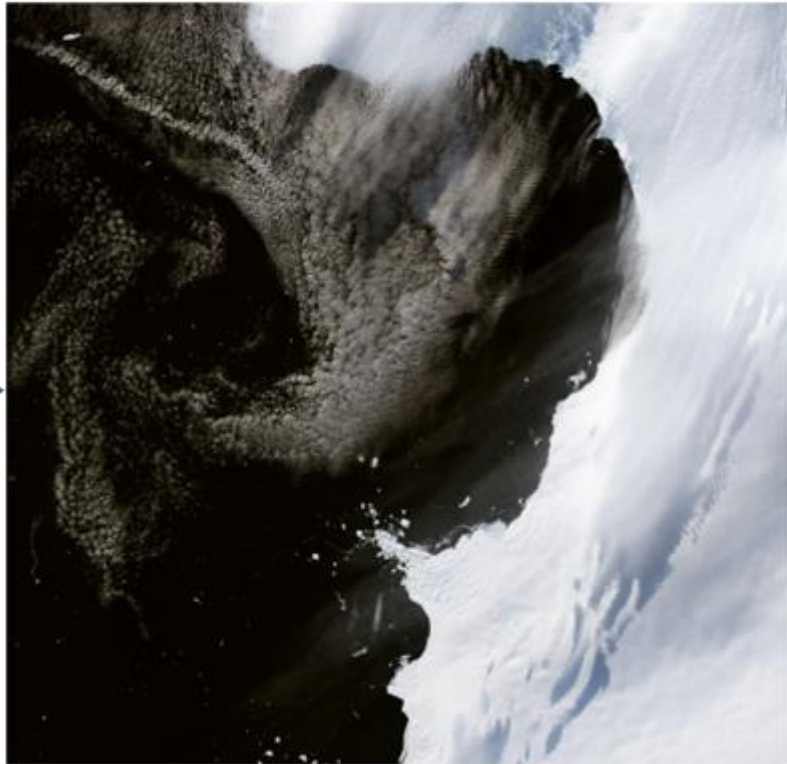


types of  
stratocumulus  
clouds

[RAMMB/CIRA SLIDER]

sea-ice & water  
at Eltanin Bay

[NASA's Earth observatory]



algae bloom  
in Lake St. Clair

[NASA's Earth observatory]



An aerial photograph of a savanna landscape. The terrain is a mix of brownish soil and patches of green vegetation. The vegetation is arranged in a regular, repeating pattern of small, rounded clumps, which is a classic example of Turing patterns. In the center-right, there is a larger, irregularly shaped area of white, sandy soil. The overall scene illustrates the self-organizing nature of ecosystems.

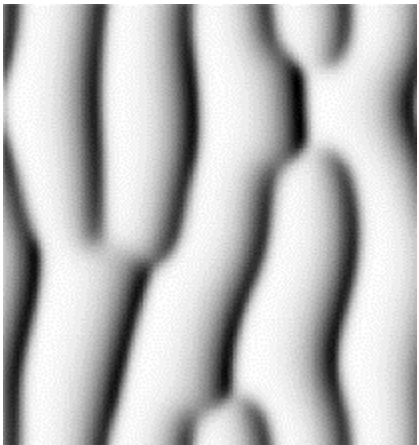
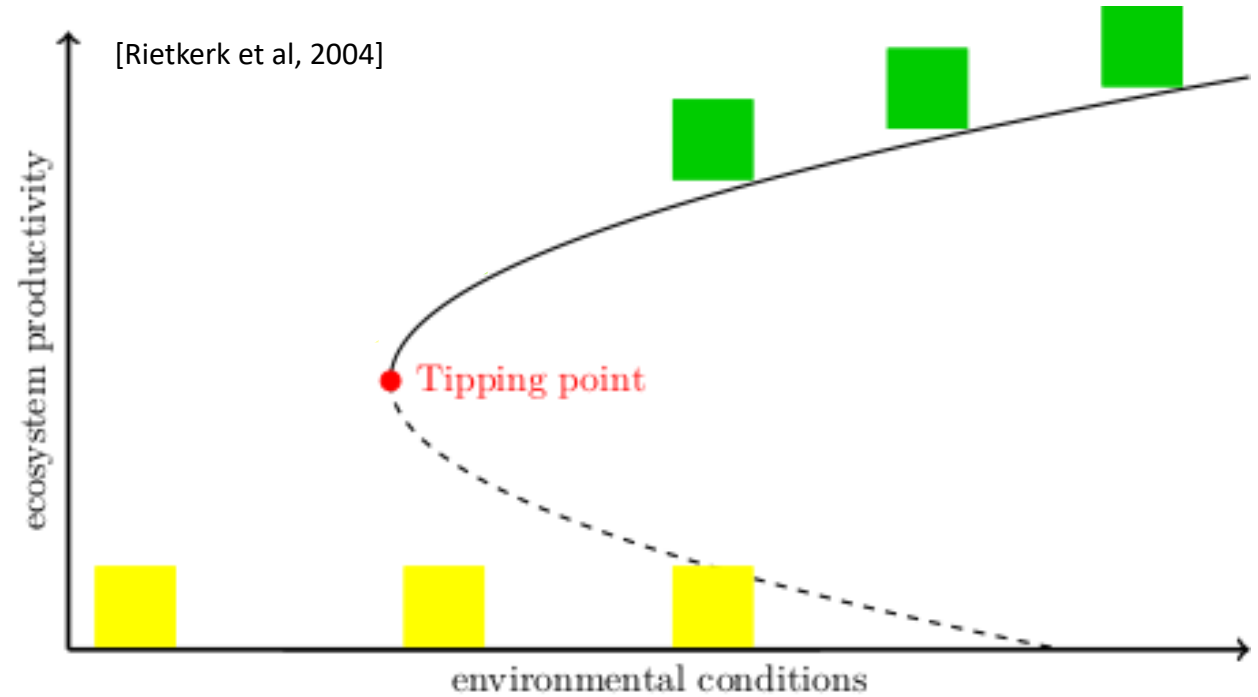
# Part 1: Turing Patterns



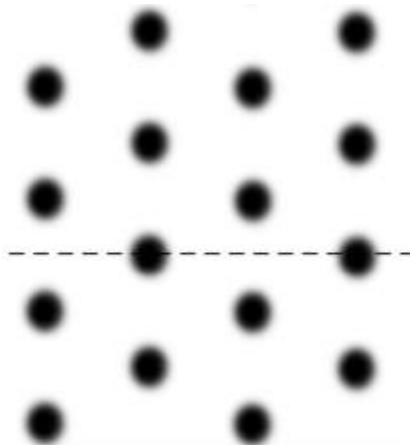
# Patterns in models

Add spatial transport:  
Reaction-Diffusion equations:

$$\begin{cases} \frac{du}{dt} = f(u, v) + D_u \Delta u \\ \frac{dv}{dt} = g(u, v) + D_v \Delta v \end{cases}$$



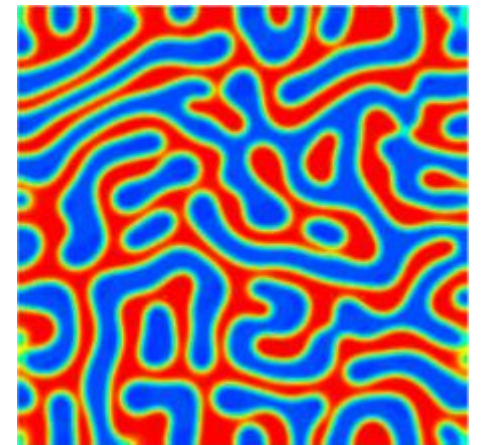
[Klausmeier, 1999]



[Gilad et al, 2004]

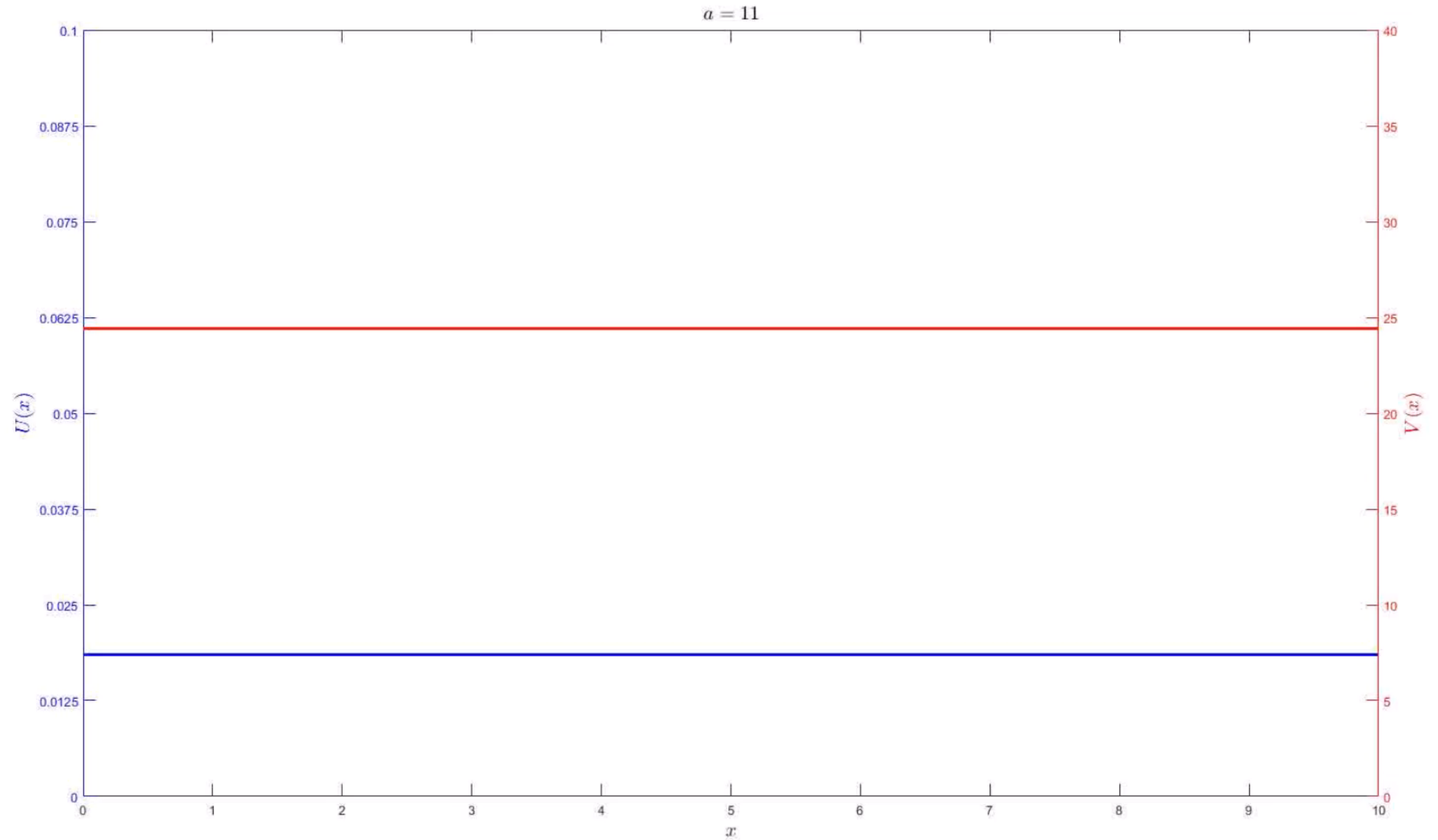


[Rietkerk et al, 2002]



[Liu et al, 2013]

# Behaviour of PDEs





# Turing patterns

$$\begin{cases} \frac{du}{dt} = f(u, v) + D_u \Delta u \\ \frac{dv}{dt} = g(u, v) + D_v \Delta v \end{cases}$$

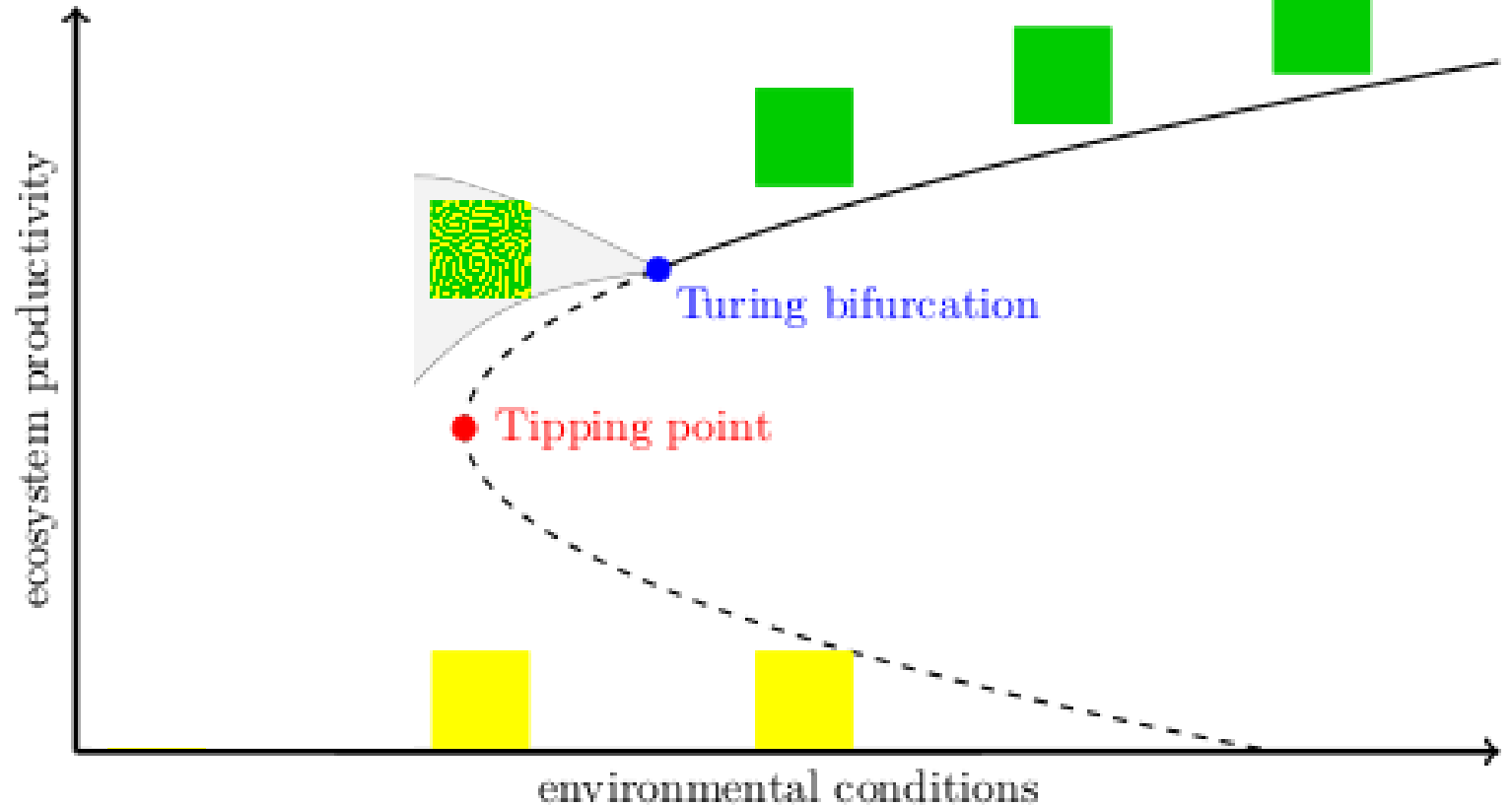
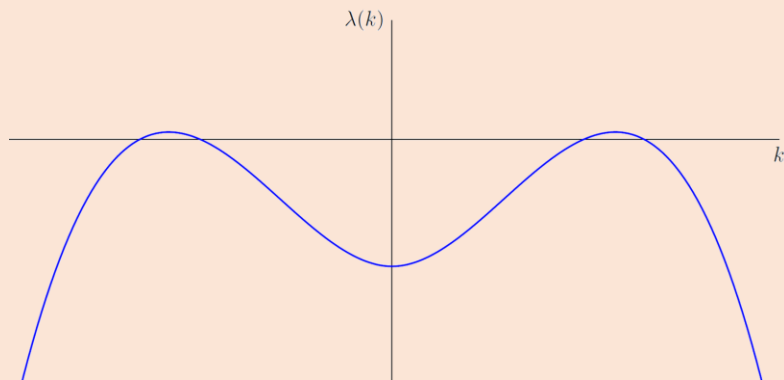
## Turing bifurcation

Instability to non-uniform perturbations

$$\begin{pmatrix} u \\ v \end{pmatrix} = \begin{pmatrix} u_* \\ v_* \end{pmatrix} + e^{\lambda t} e^{ikx} \begin{pmatrix} \bar{u} \\ \bar{v} \end{pmatrix}$$

→ Dispersion relation

$$\lambda(k) = \dots$$



## Weakly non-linear analysis

Ginzburg-Landau equation / Amplitude Equation  
& Eckhaus/Benjamin-Feir-Newell criterion

[Eckhaus, 1965; Benjamin & Feir, 1967; Newell, 1974]

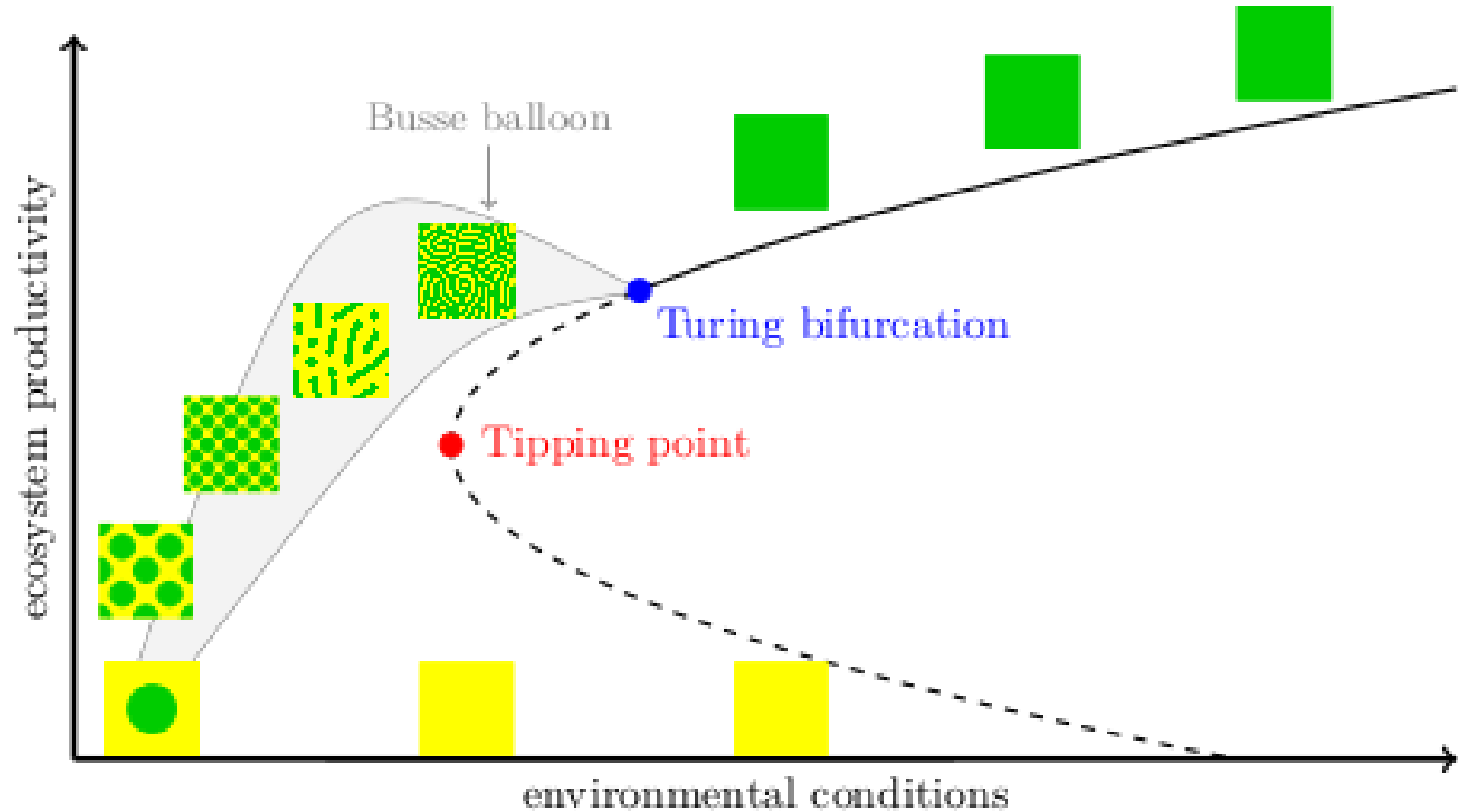


# Busse balloon

$$\begin{cases} \frac{du}{dt} = f(u, v) + D_u \Delta u \\ \frac{dv}{dt} = g(u, v) + D_v \Delta v \end{cases}$$

## Busse balloon

A model-dependent shape in *(parameter, observable)* space that indicates all stable patterned solutions to the PDE.



## Construction Busse balloon

Via numerical continuation

few general results on the shape of Busse balloon

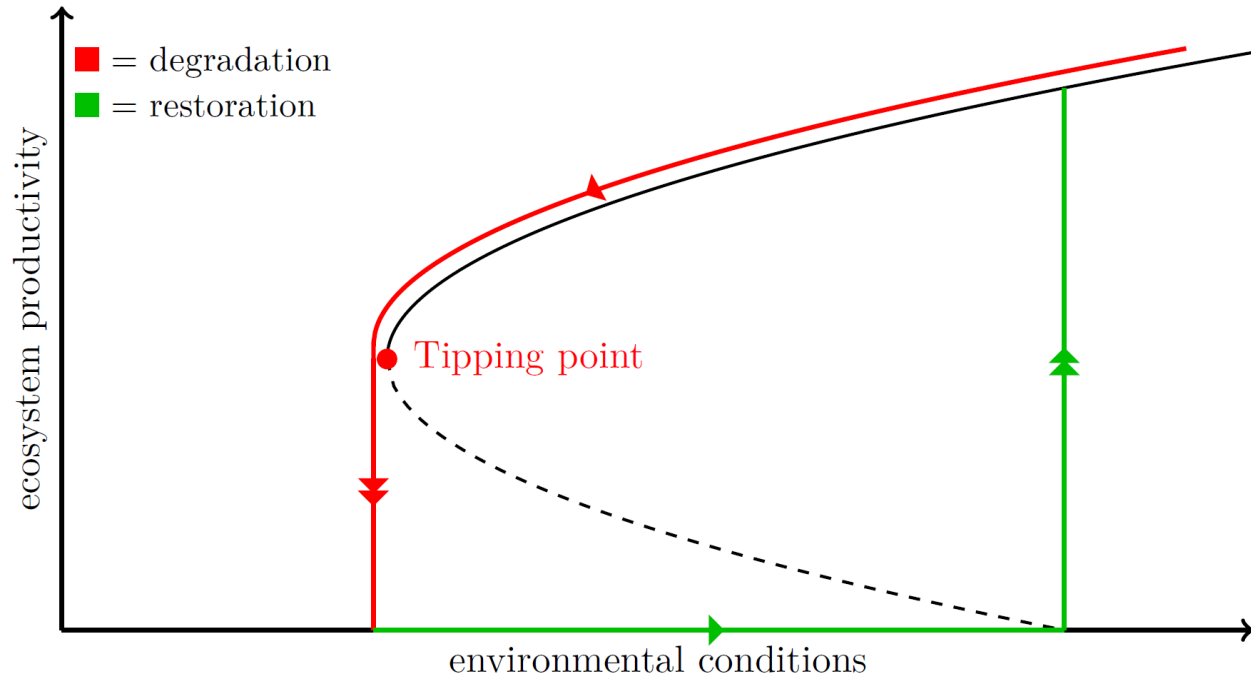
## Busse balloon

Idea originates from thermal convection

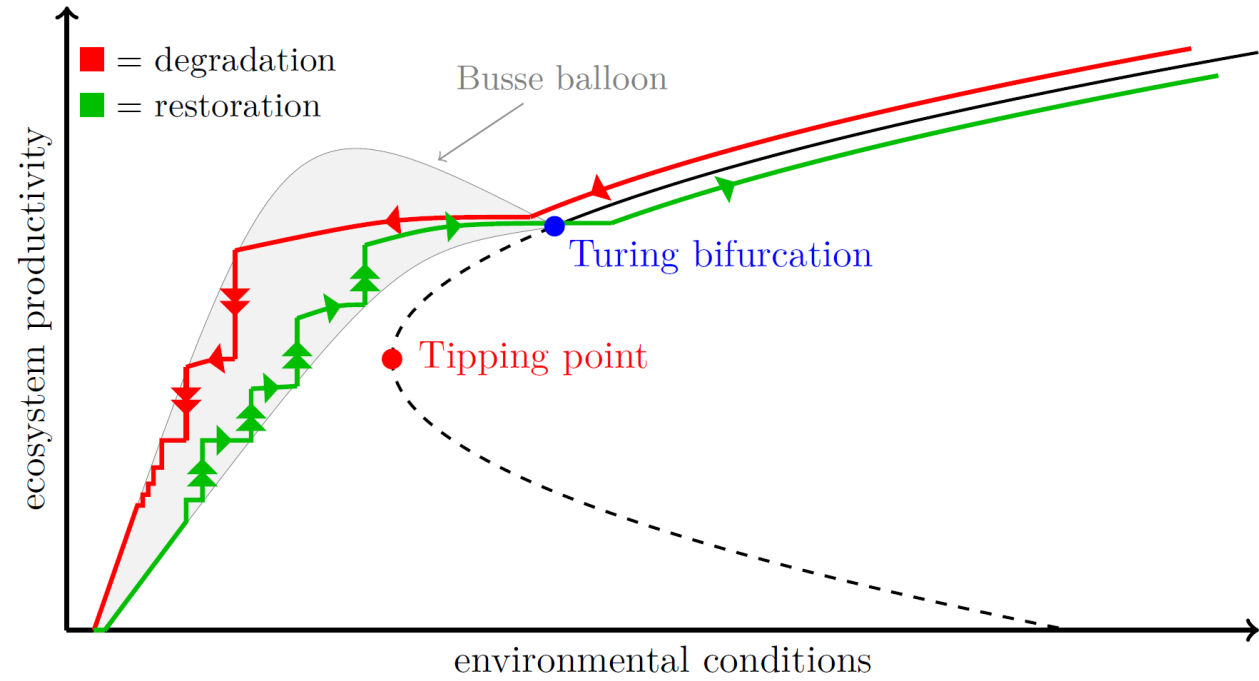
[Busse, 1978]



# Tipping of (Turing) patterns

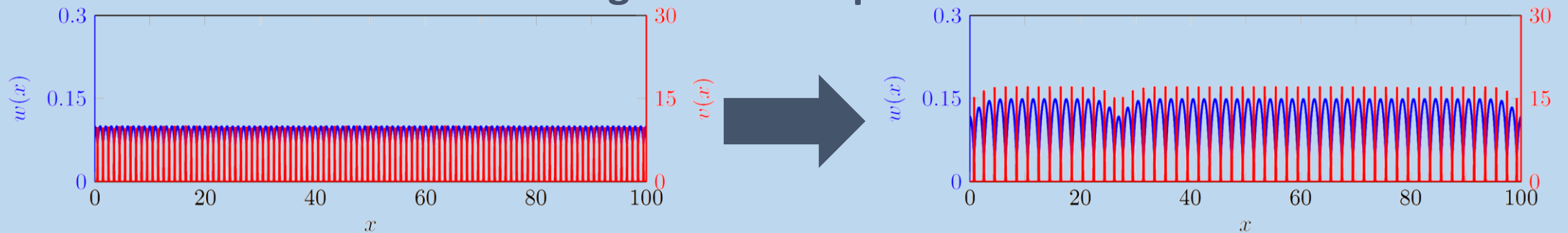


Classic tipping



Tipping of patterns

## Degradation of patterns



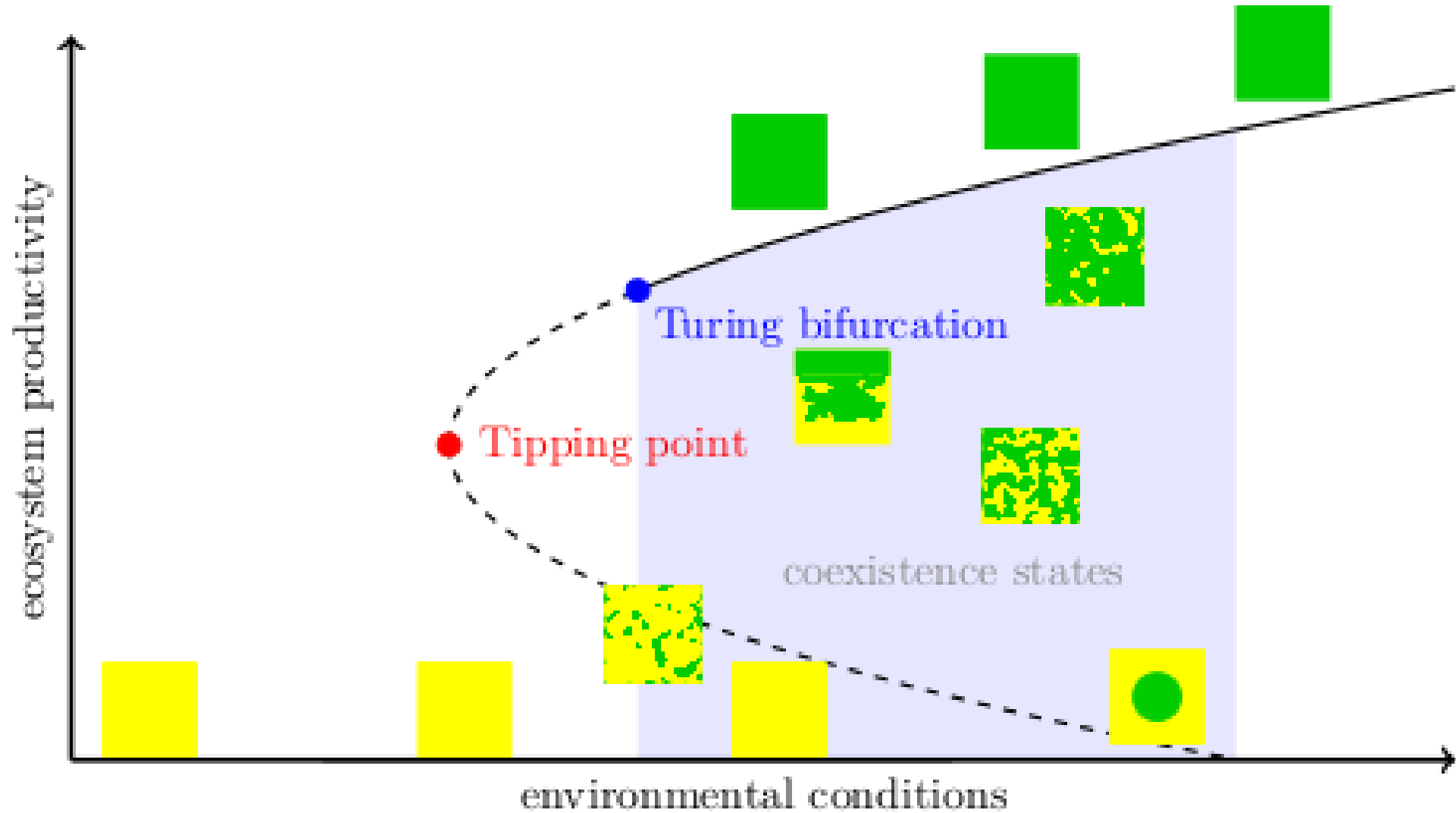




Part 2:

Coexistence States  
and spatial heterogeneities

# Coexistence states in bifurcation diagram

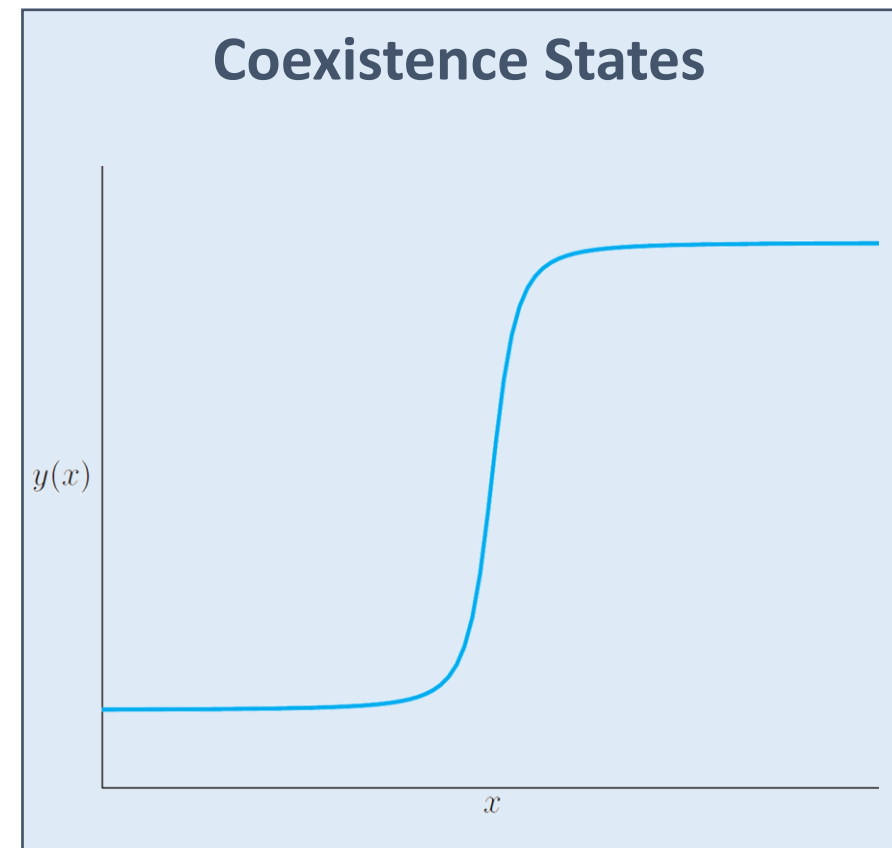
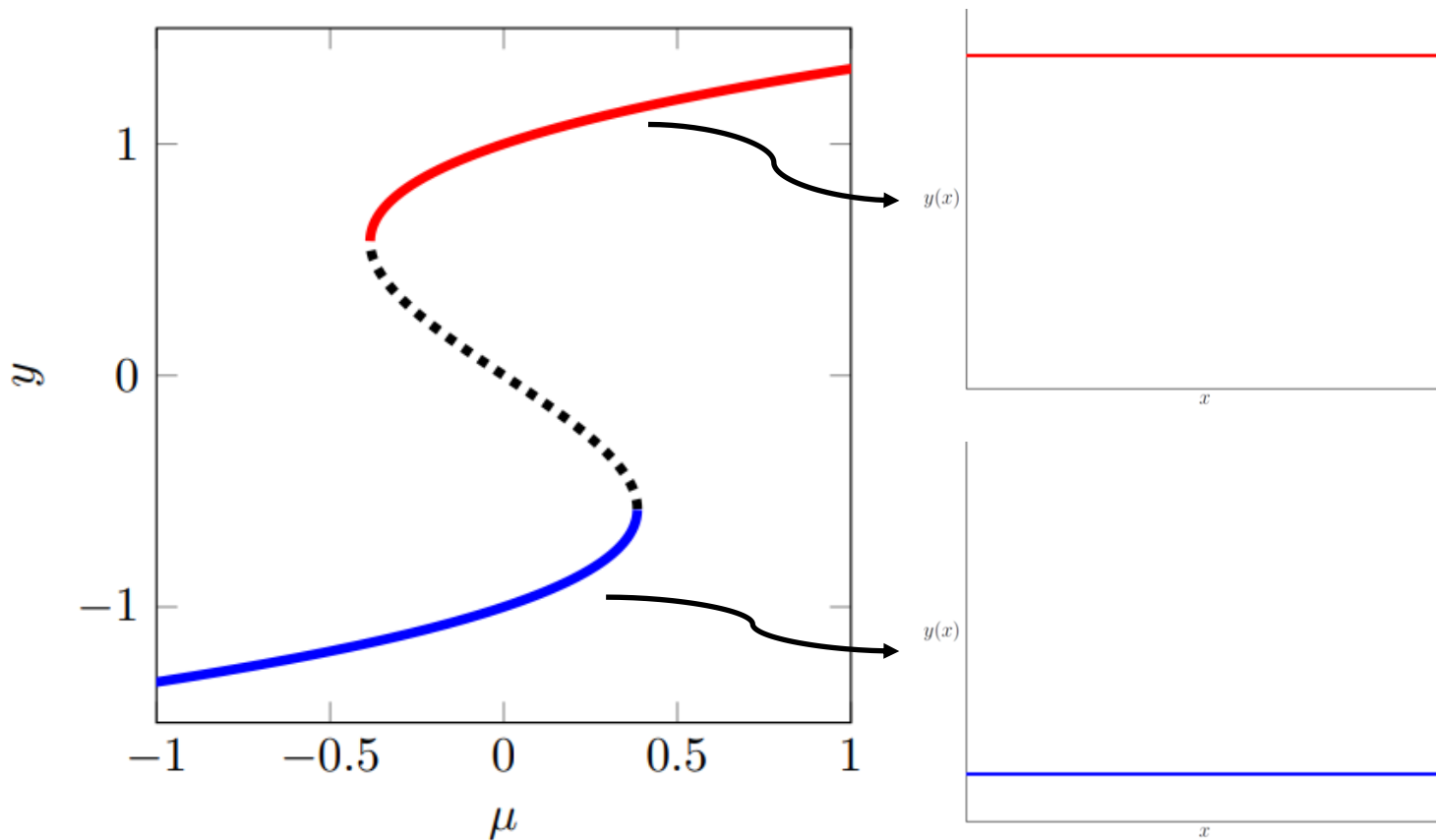




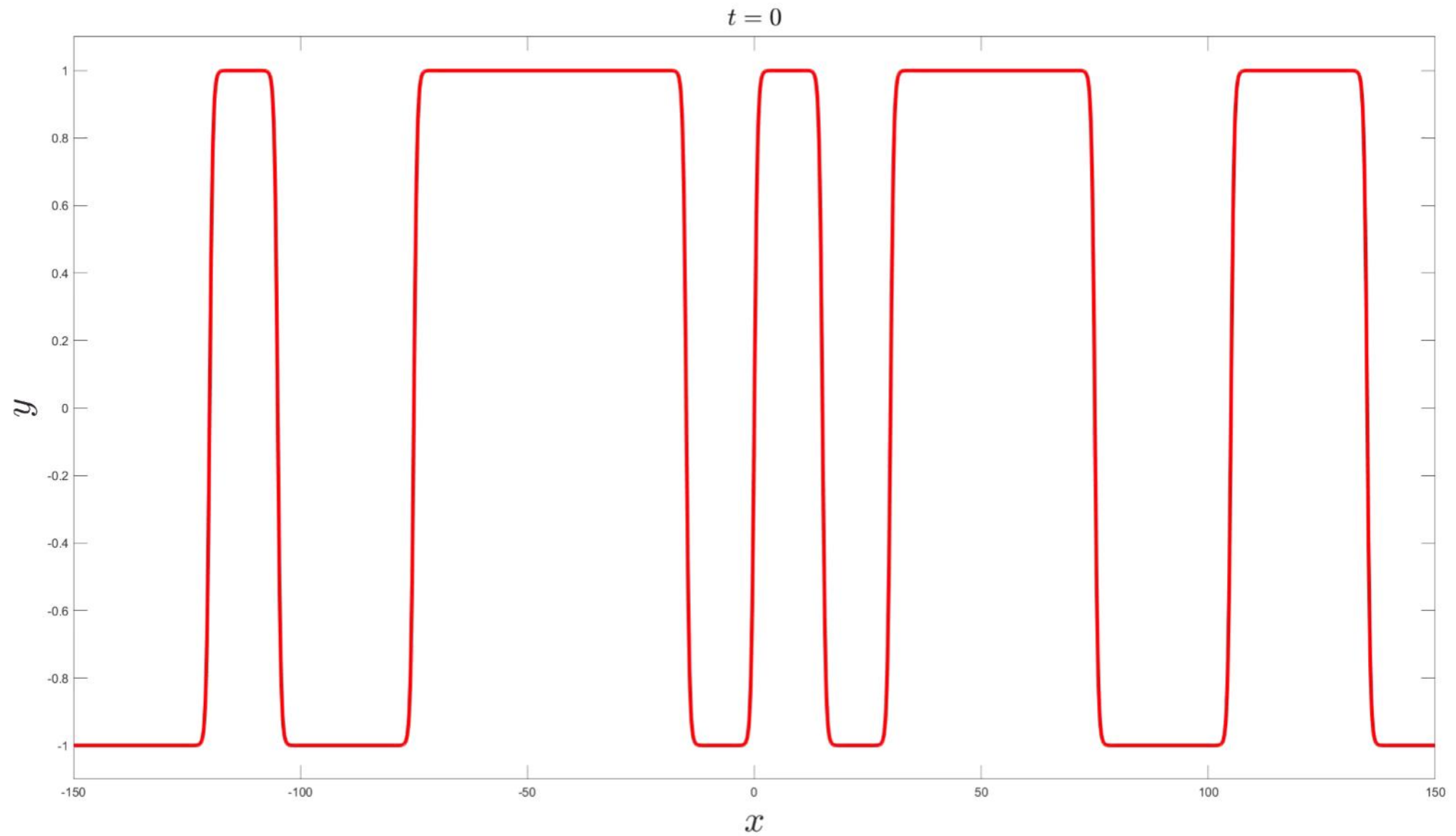
# Coexistence states

Bistable (Allen-Cahn/Nagumo) equation:

$$\frac{\partial y}{\partial t} = y(1 - y^2) + \mu + D \frac{\partial^2 y}{\partial x^2}$$



Dynamics of  $\frac{\partial y}{\partial t} = D \frac{\partial^2 y}{\partial x^2} + y(1 - y^2) + \mu$



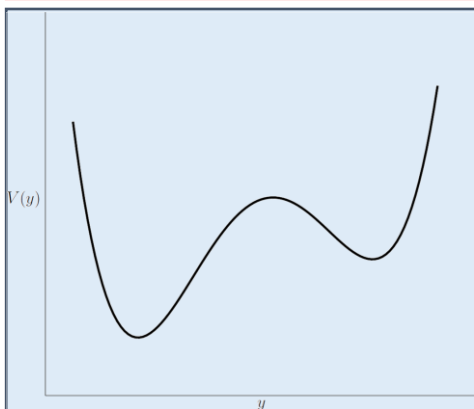
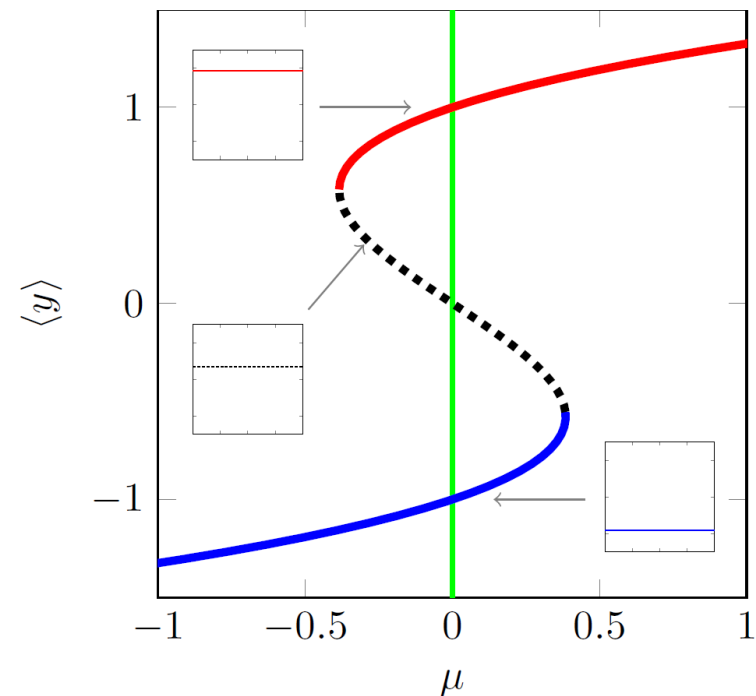


# Front Dynamics

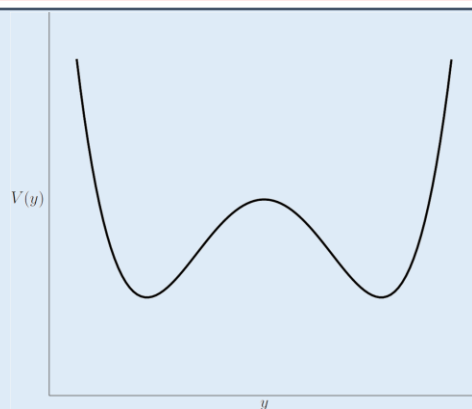
$$\frac{\partial y}{\partial t} = D \frac{\partial^2 y}{\partial x^2} + f(y; \mu)$$

Potential function  $V(y; \mu)$ :

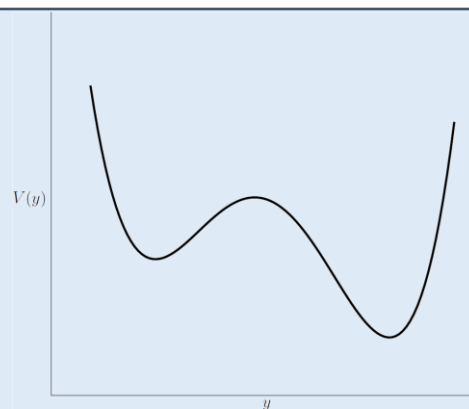
$$\frac{\partial V}{\partial y}(y; \mu) = -f(y; \mu)$$



moves right

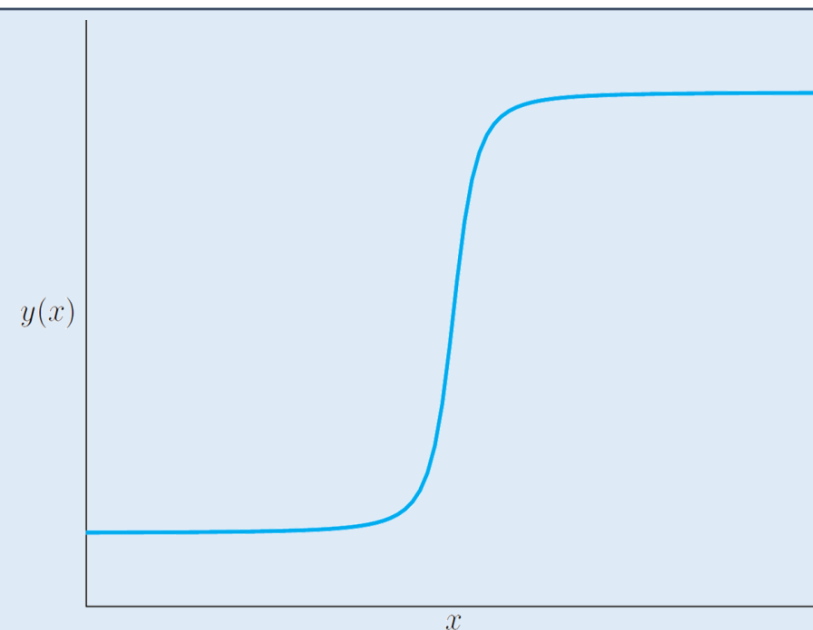


stationary



moves left

**Maxwell Point  $\mu_{maxwell}$**



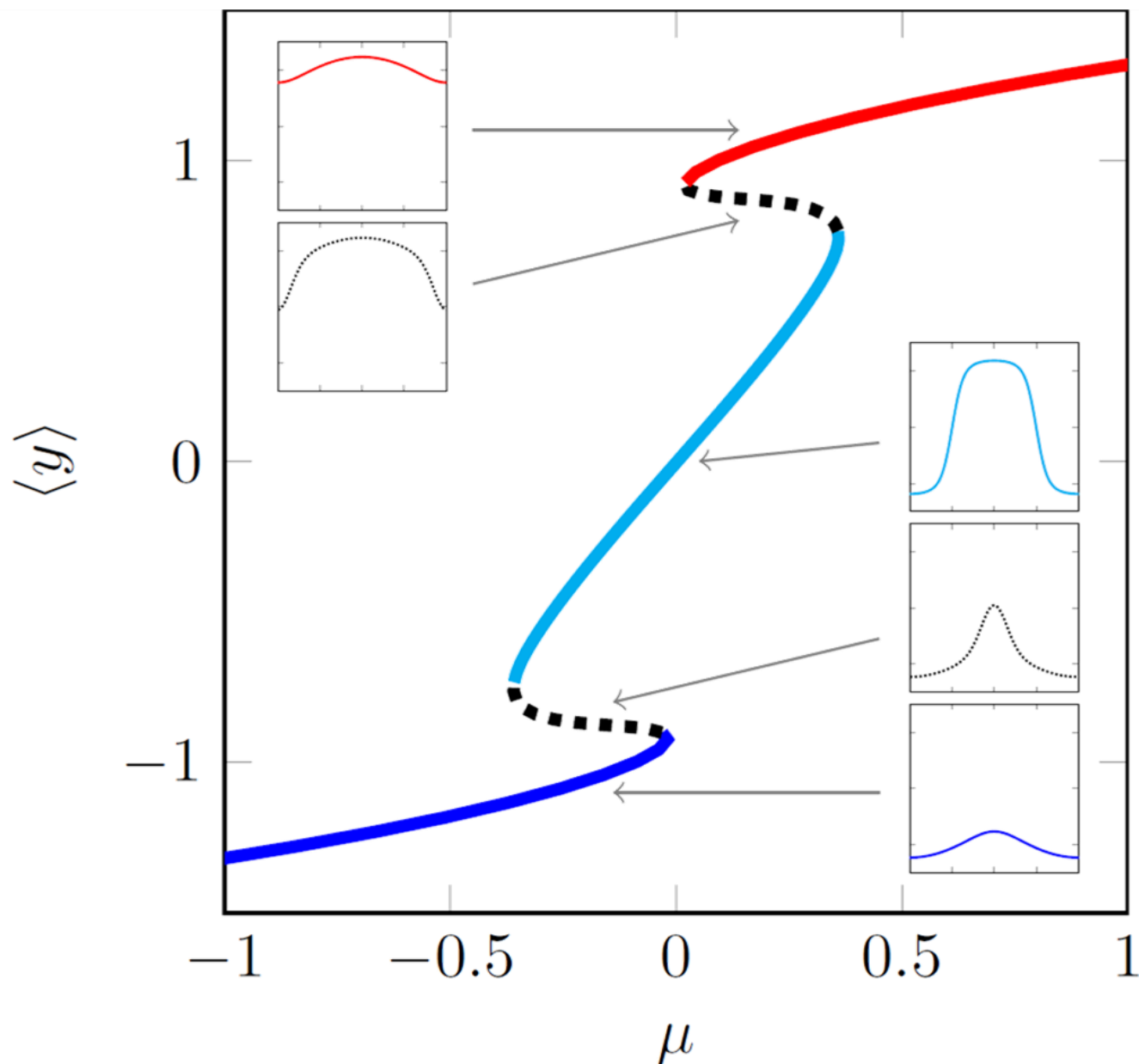
# Adding Spatial Heterogeneity

$$\frac{\partial y}{\partial t} = D \frac{\partial^2 y}{\partial x^2} + f(y, x; \mu)$$

Now, the **local** difference in potentials determines the front movement

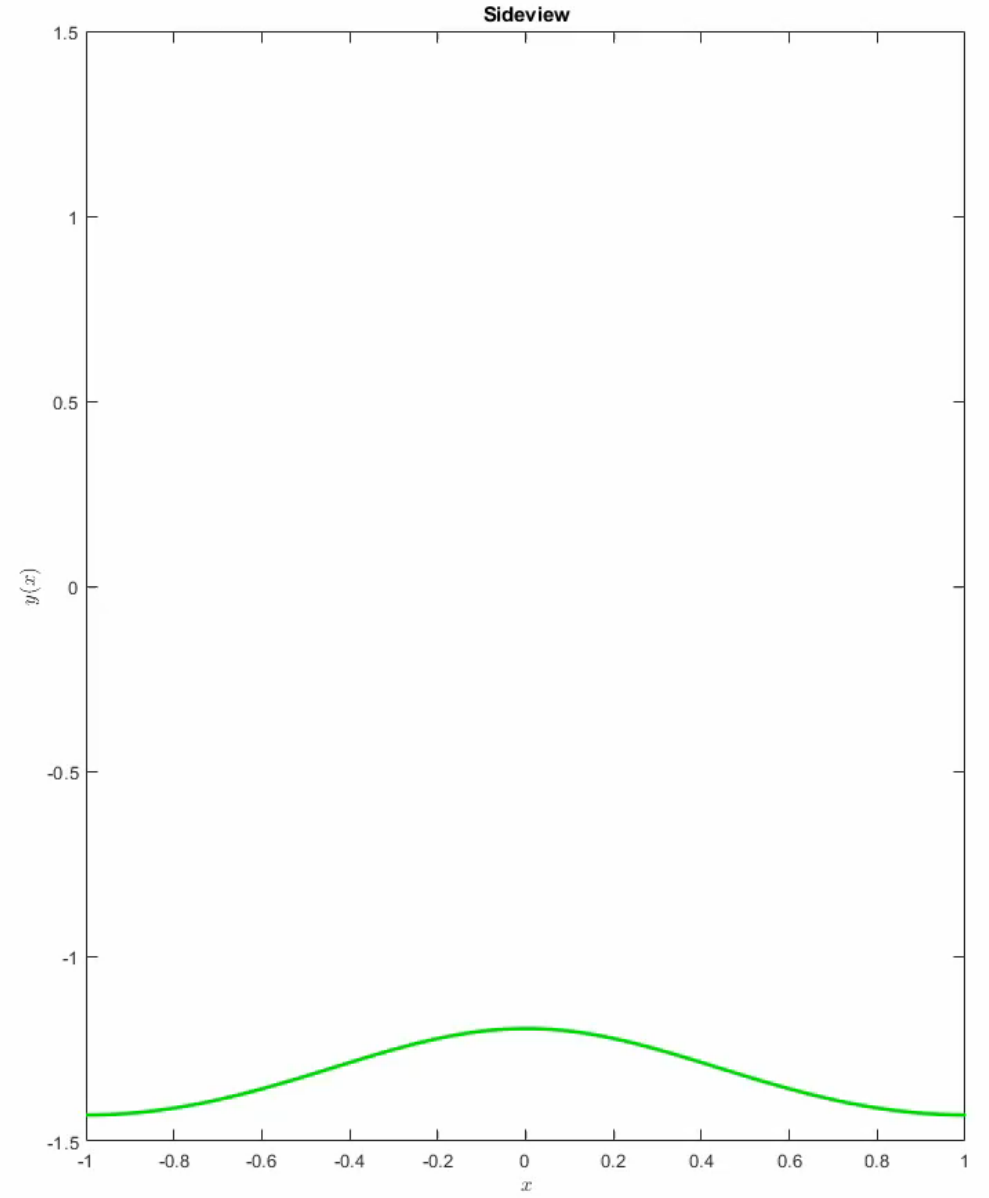
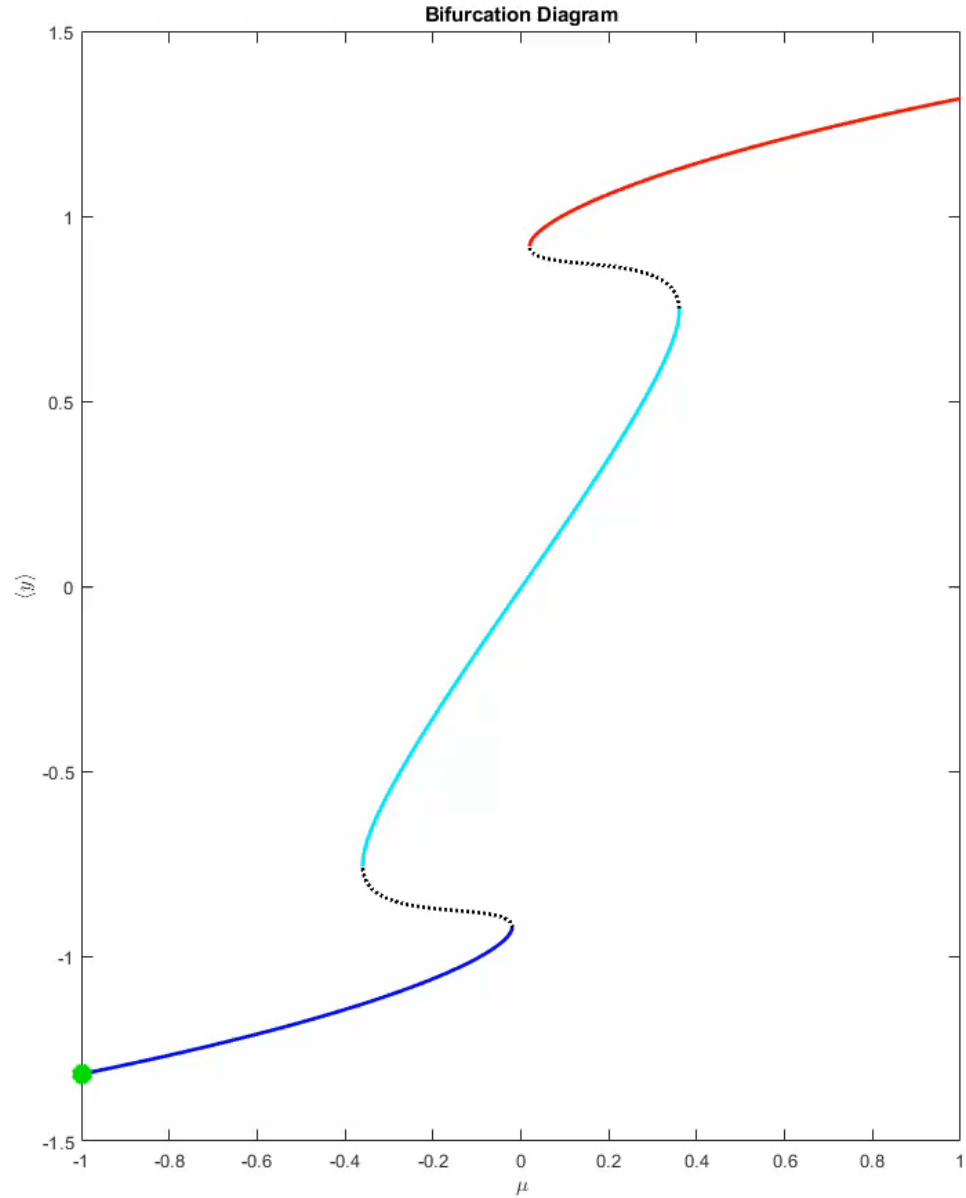
New behaviour:

- Multi-fronts can be stationary
- Maxwell point is smeared out





# Fragmented Tipping



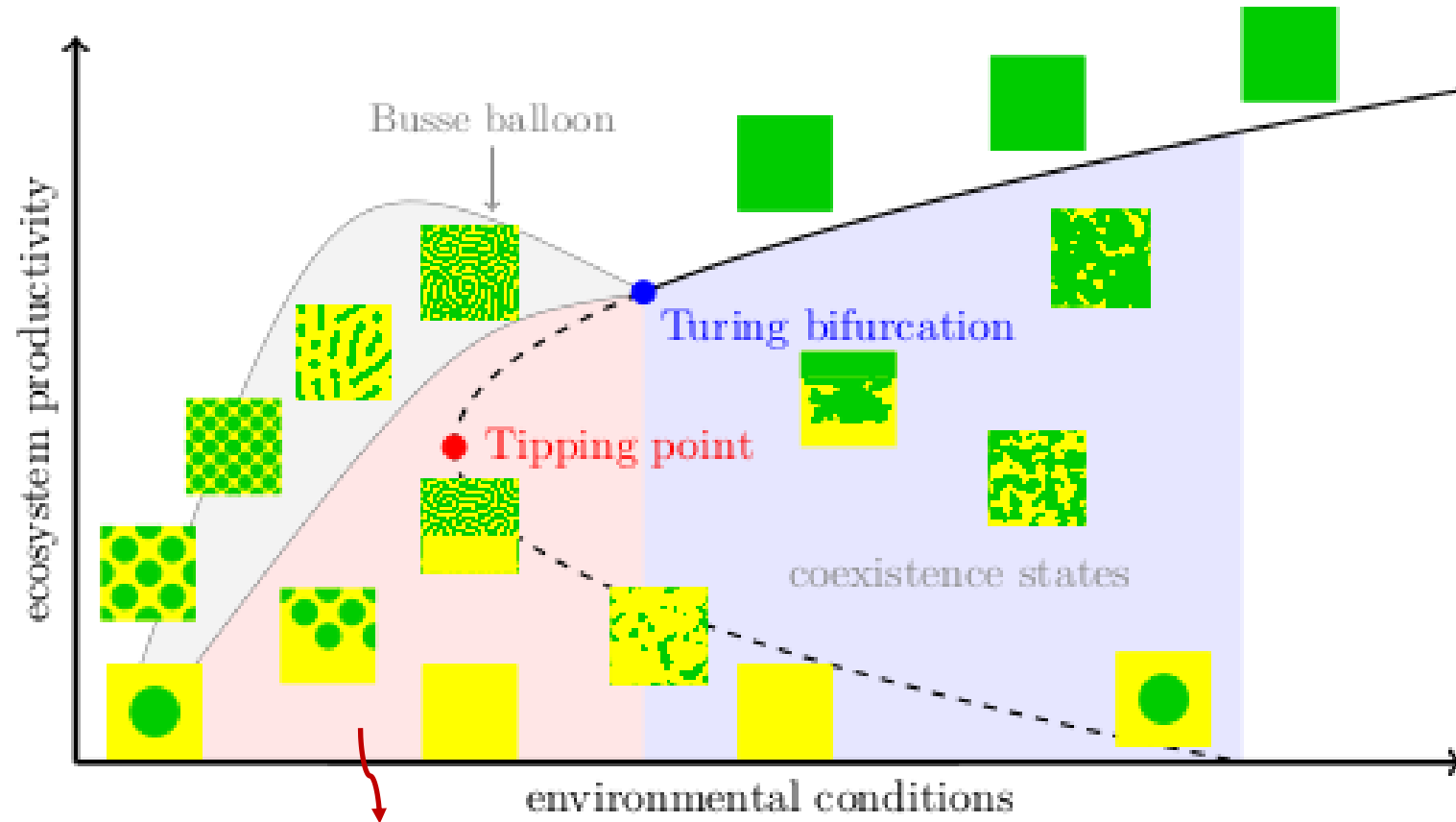




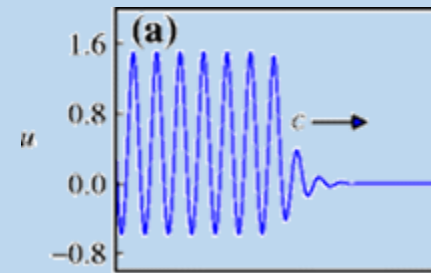
**Part 3:  
Tipping in Spatially  
Extended Systems?**



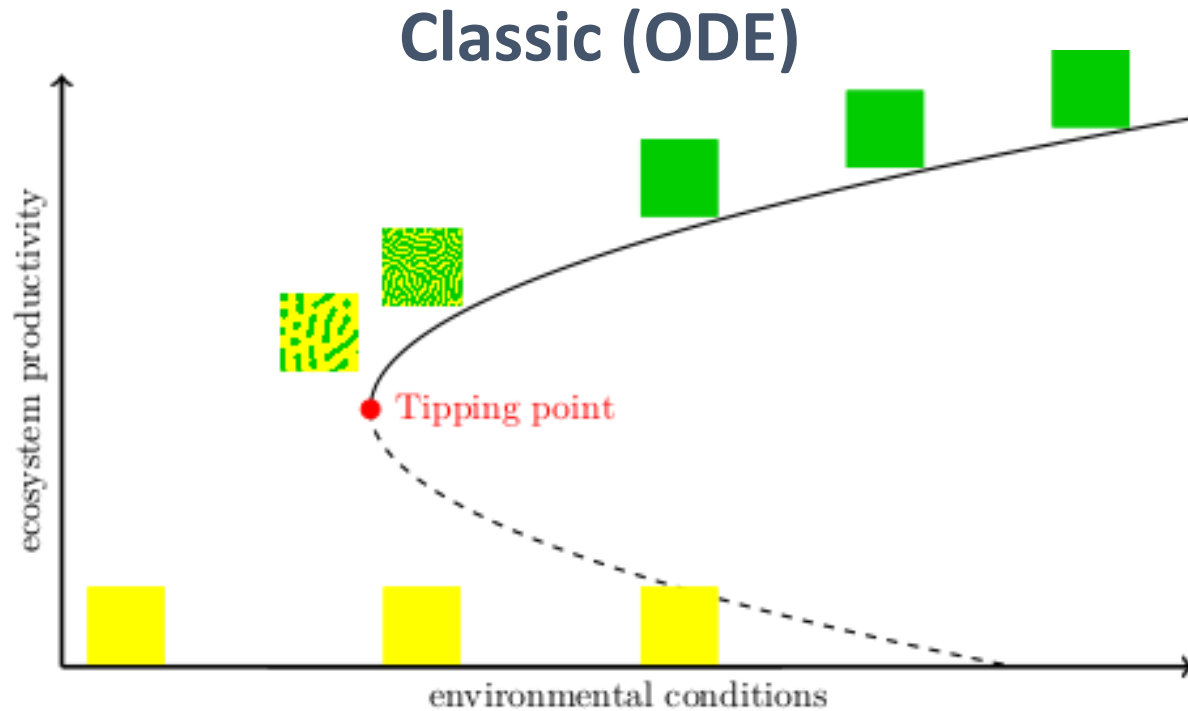
# “Bifurcation Diagram” for spatially extended systems



Coexistence states  
between patterned and  
uniform states also exist

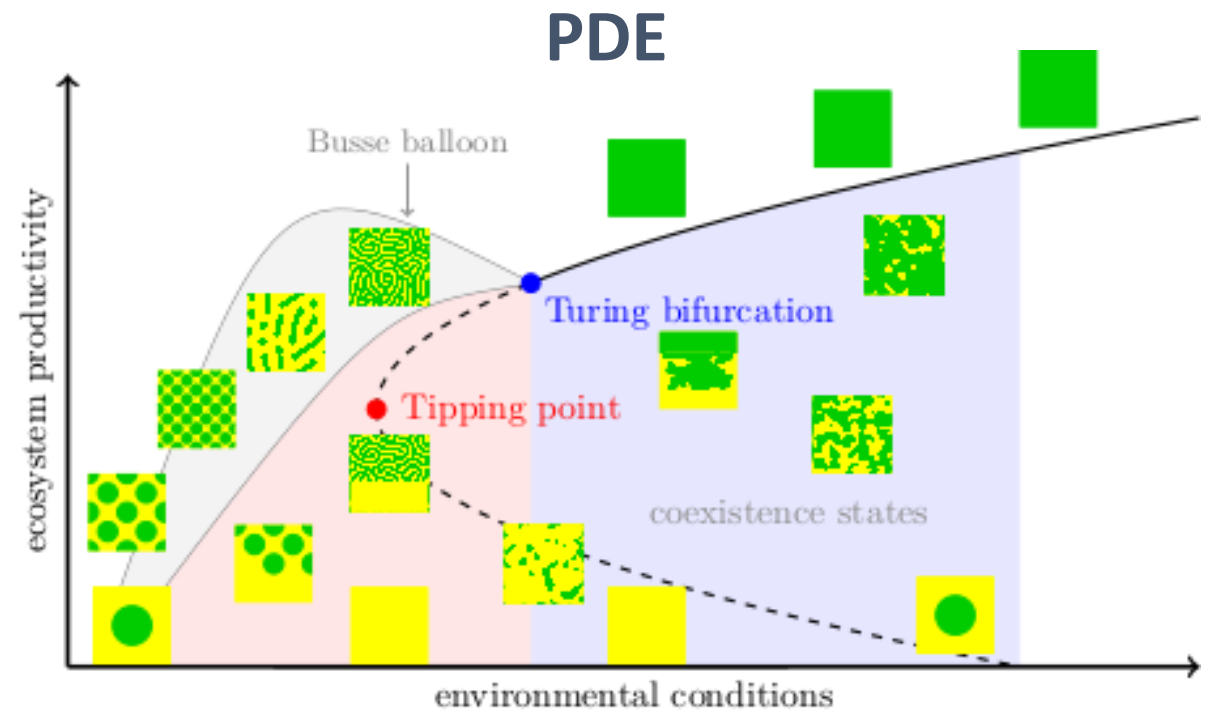


# What if the system tips?



Crossing a Tipping Point:  
→ Always full reorganization

**Early Warning Signals**  
signal for WHEN



Crossing a bifurcation:  
Now also possible:  
→ Spatial reorganization (Turing patterns)  
→ Fragmented tipping (coexistence states)

**Early Warning Signals**  
need to signal WHEN & WHAT



An aerial photograph of a vast lavender field. The rows of purple flowers are densely packed and stretch across the landscape. A dirt road runs diagonally through the field, and a single green tree stands on the right side of the road. The overall scene is bright and colorful, with the purple of the lavender contrasting sharply with the brown of the dirt and the green of the tree.

**Part 4:**

**Mathematical  
Differences Between  
ODEs & PDEs**



# Differences between ODEs and PDEs

ODE

$$y_t = f(y; \mu)$$

PDE

$$y_t = y_{xx} + f(y; \mu)$$

Stationary States

$$0 = f(y^*; \mu)$$

$$0 = y_{xx}^* + f(y^*; \mu)$$

Linear Stability

$$\lambda \bar{y} = f_y(y^*; \mu) \bar{y}$$

$$\lambda \bar{y} = \bar{y}_{xx} + f_y(y^*(x); \mu) \bar{y}$$

# Stationary States

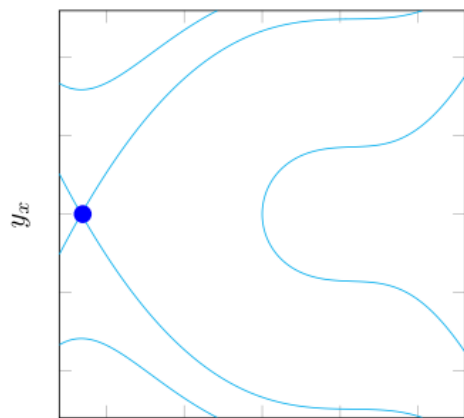
$$y_t = y_{xx} + f(y; \mu)$$

**Stationary states**

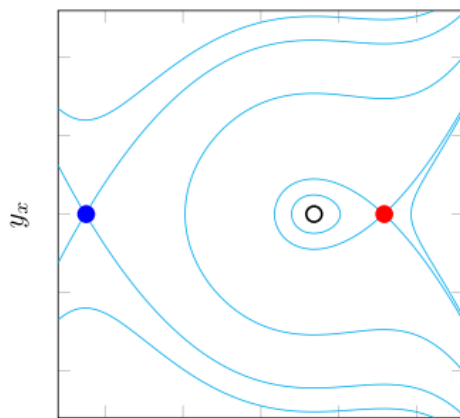
$$0 = y_{xx} + f(y; \mu)$$



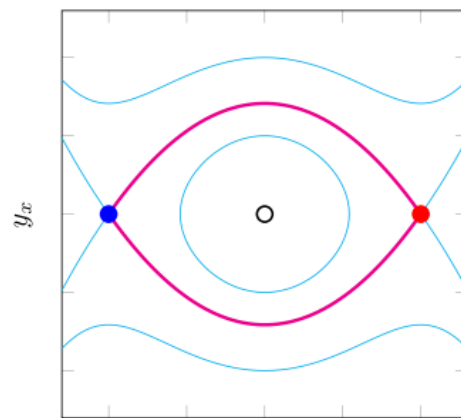
$$\begin{cases} y_x = p \\ p_x = -f(y; \mu) \end{cases}$$



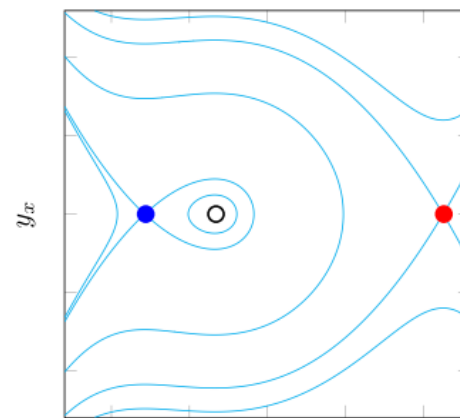
(a)  $\mu < \mu_B$



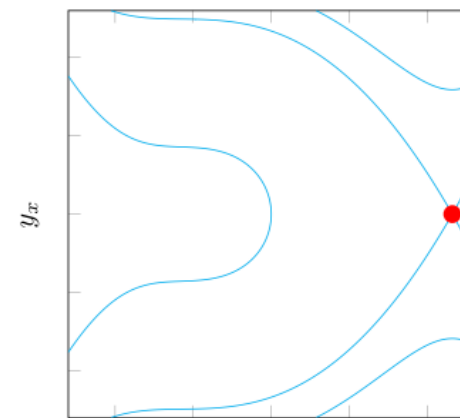
(b)  $\mu_B < \mu < \mu_M$



(c)  $\mu = \mu_M$



(d)  $\mu_M < \mu < \mu_A$



(e)  $\mu > \mu_A$

# Stability of Stationary States

ODE

$$\lambda \bar{y} = f_y(y^*; \mu) \bar{y}$$

*Im λ*

×

×

×

×

×

*Re λ*

PDE

$$\lambda \bar{y} = \bar{y}_{xx} + f_y(y^*(x); \mu) \bar{y}$$

*Im λ*

×

×

×

×

×

×

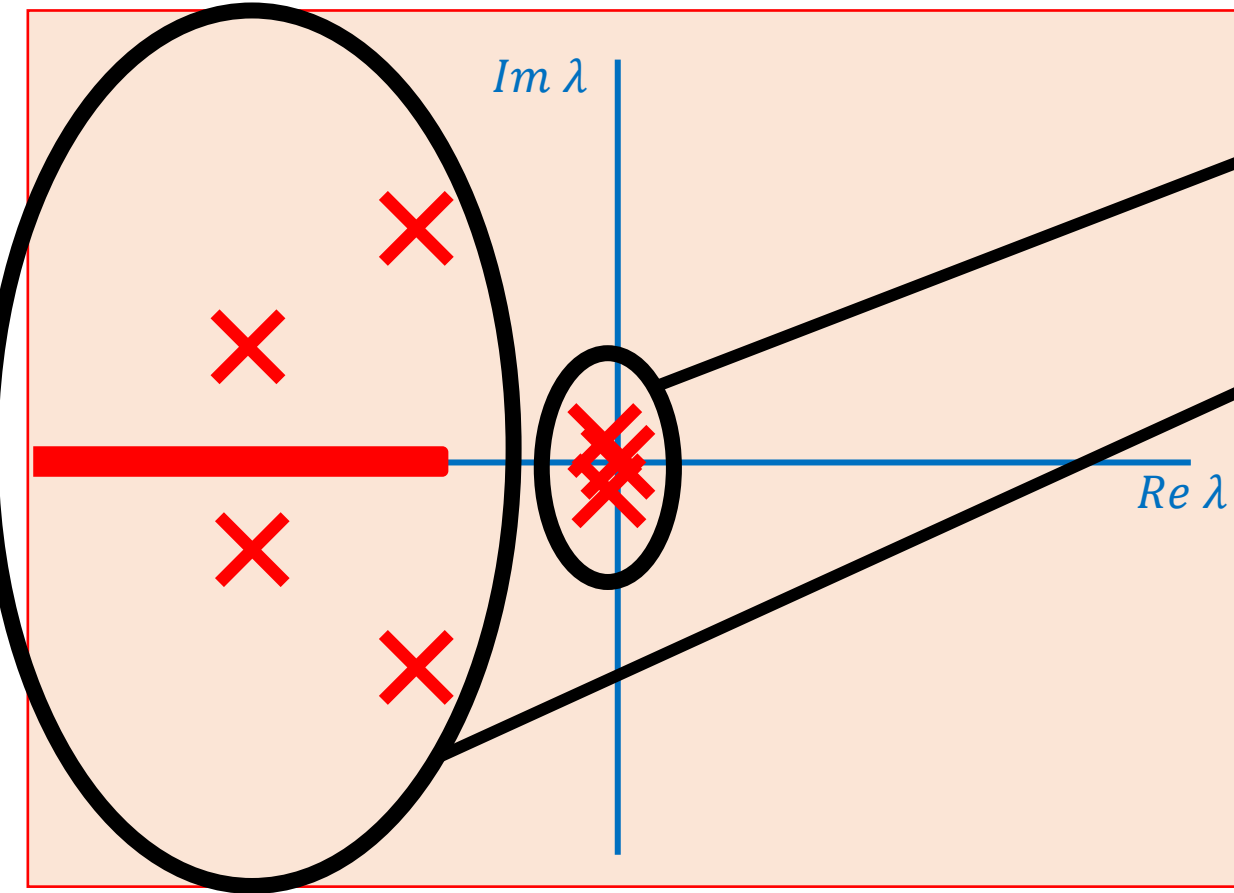
*Re λ*





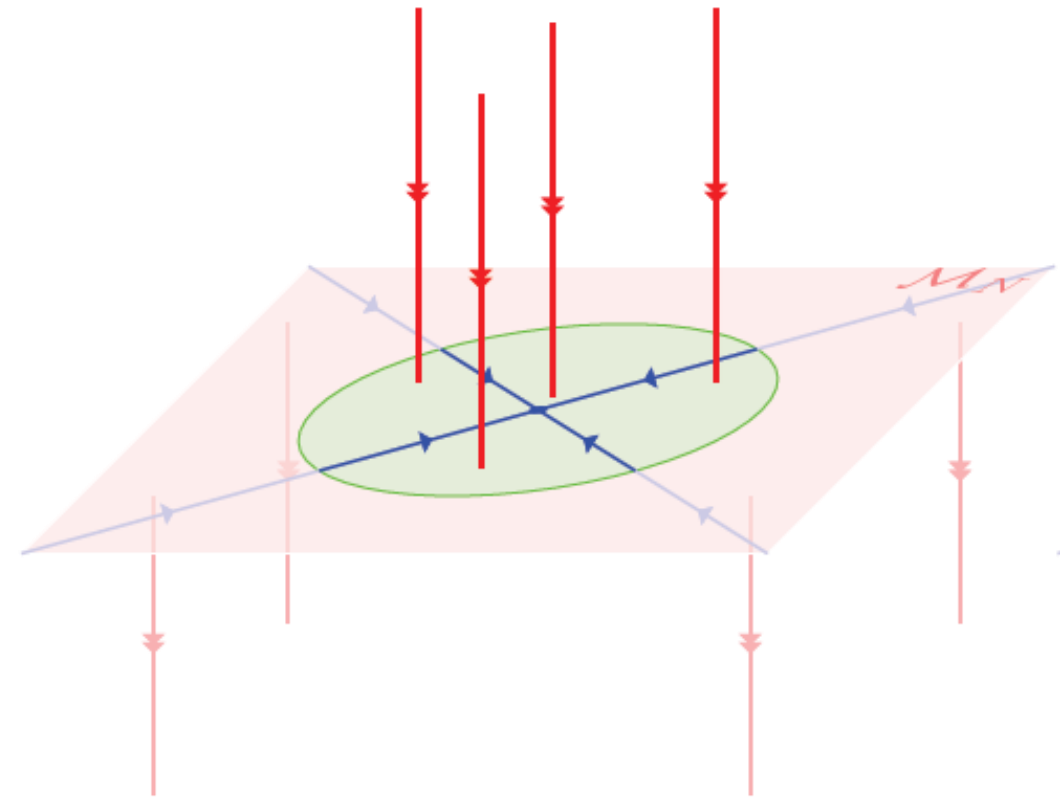
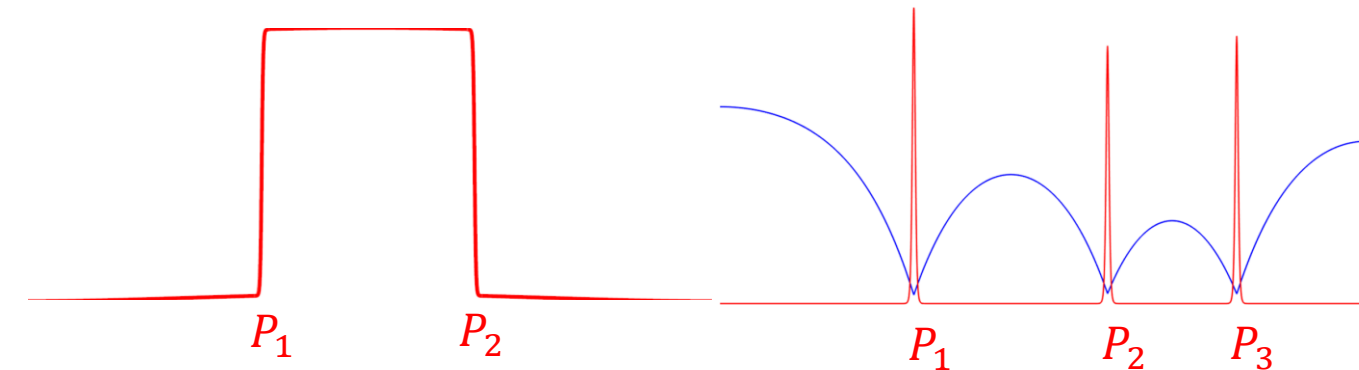
**Part 5:  
Dynamics &  
Bifurcations of  
Patterned States**

# Dynamics of Patterned States



1. SLOW Pattern Adaptation

2. FAST Pattern Degradation





# 1. SLOW pattern adaptation



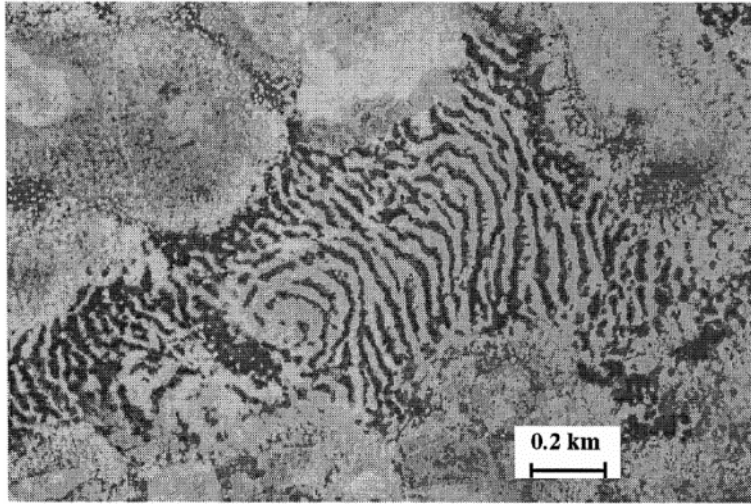
Somaliland, 1948 [Macfadyen, 1950]



Somaliland, 2008



# 2. FAST Pattern Degradation



Niger, 1950 [Valentin, 1999]



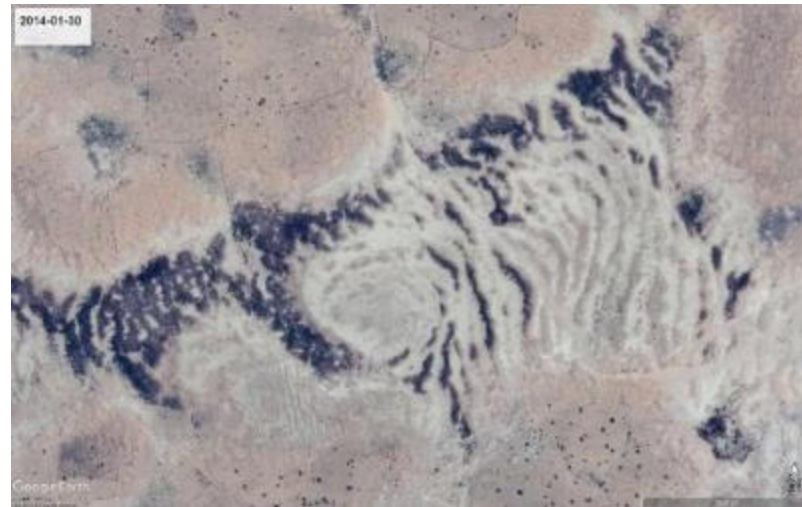
Niger, 2008



Niger, 2010



Niger, 2011

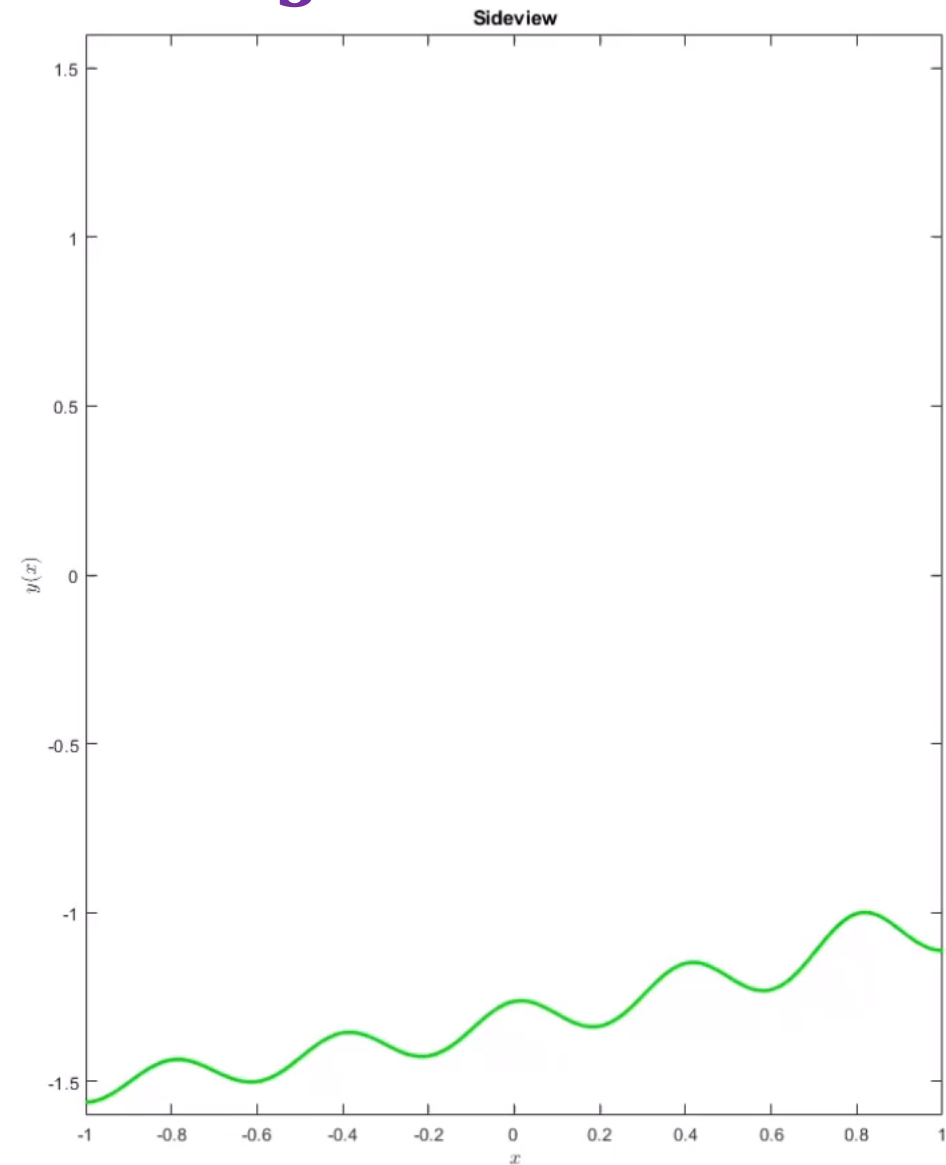
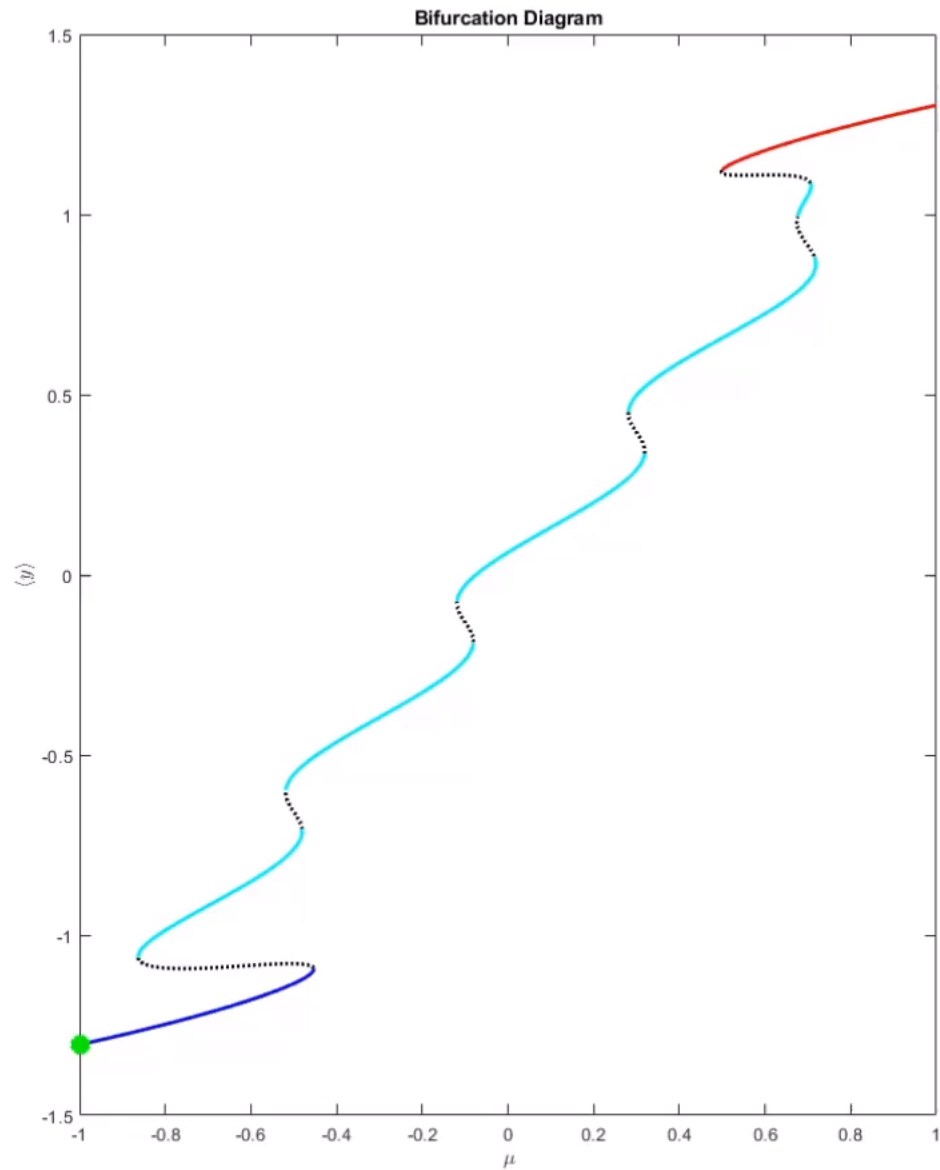


Niger, 2014



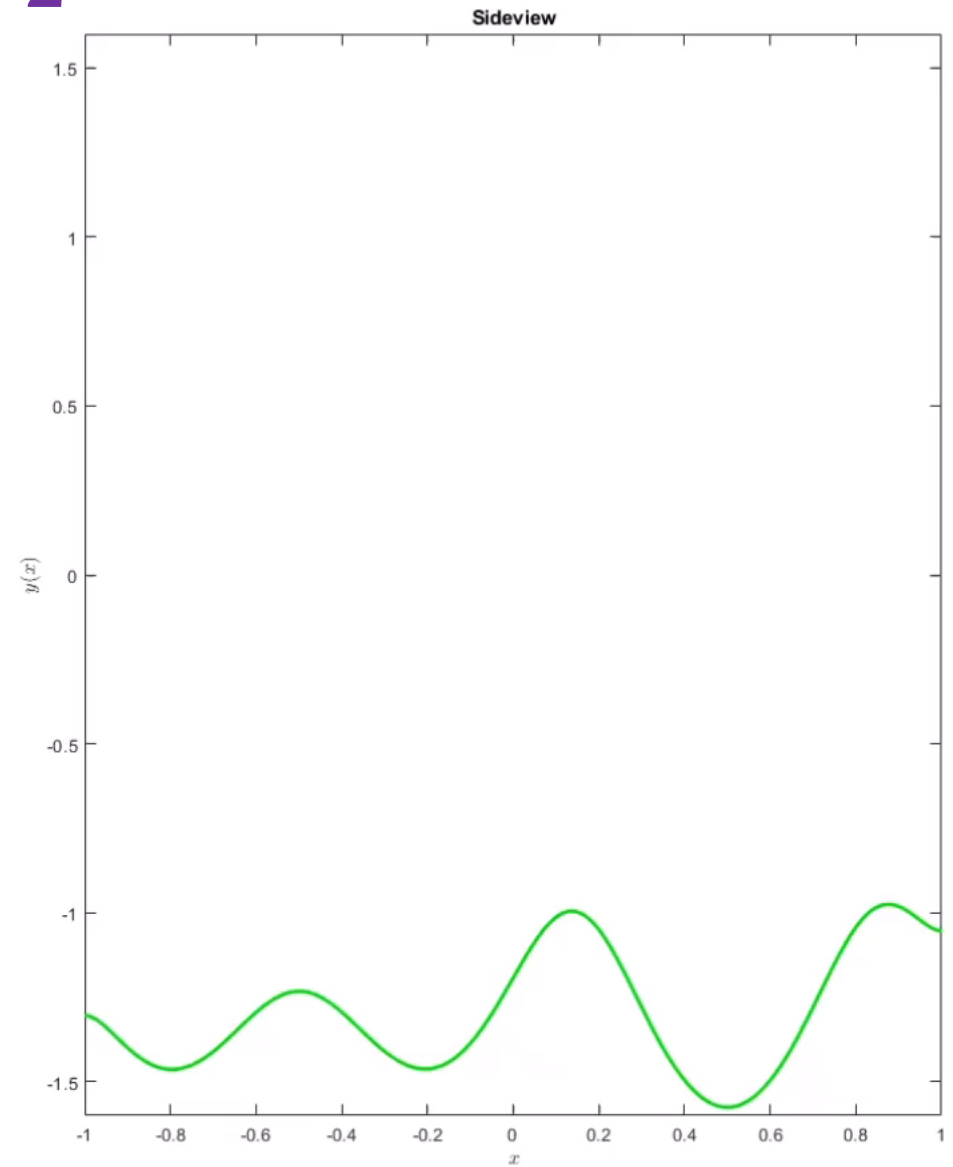
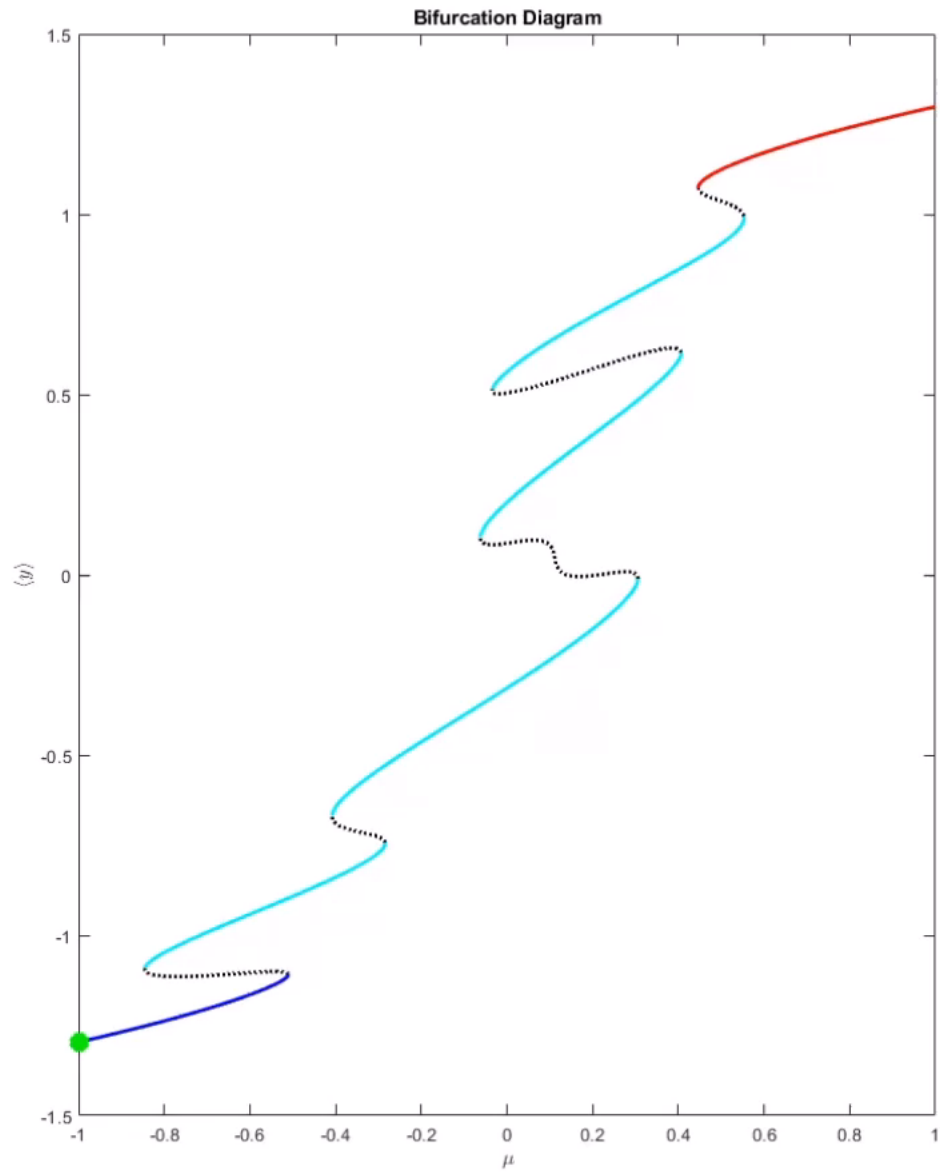
Niger, 2016

$$y_t = D y_{xx} + y(1 - y^2) + \mu + x + \frac{2}{5} \cos(5\pi x)$$

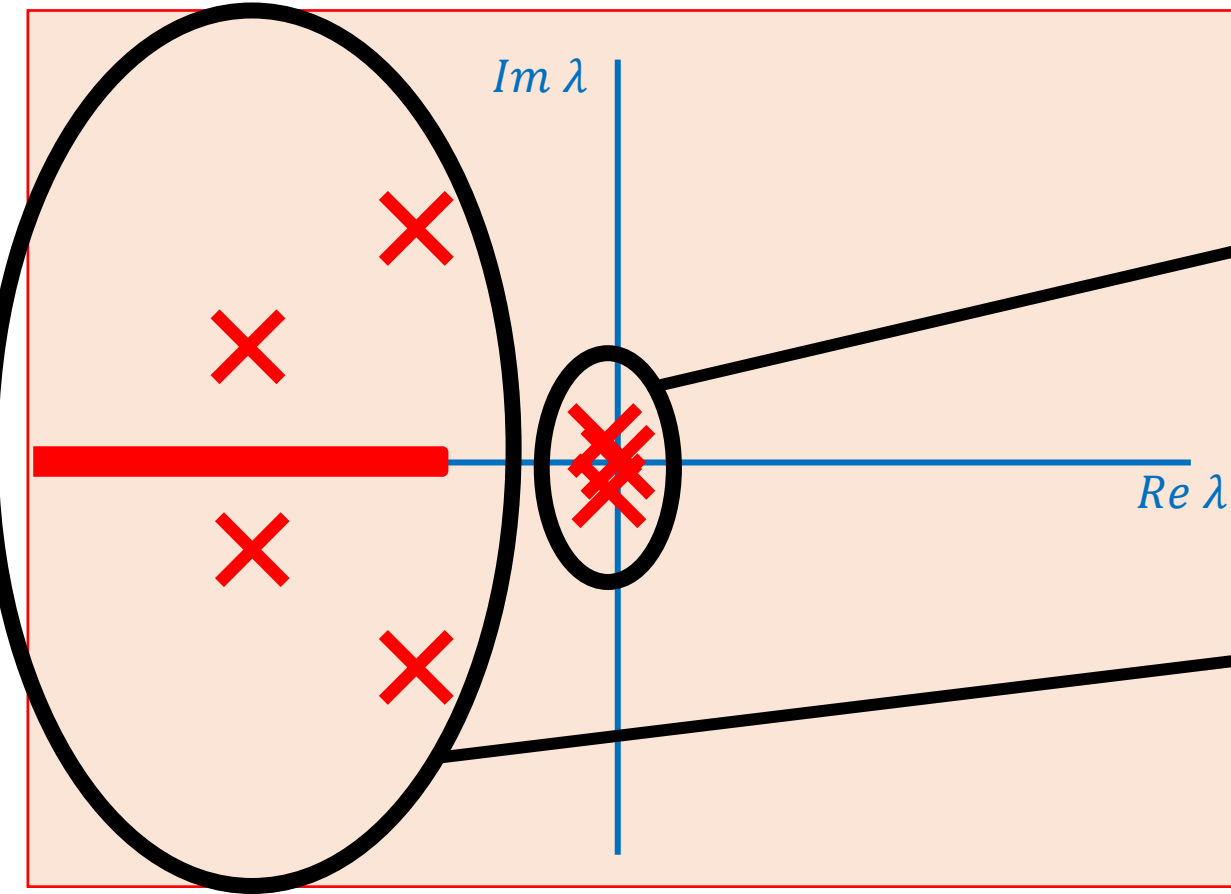




$$y_t = D y_{xx} + y(1 - y^2) + \mu + \frac{1}{2} \cos(2\pi x) + \sin(3\pi x)$$



# Bifurcations



What happens at bifurcation?

**1. SLOW Pattern Adaptation**

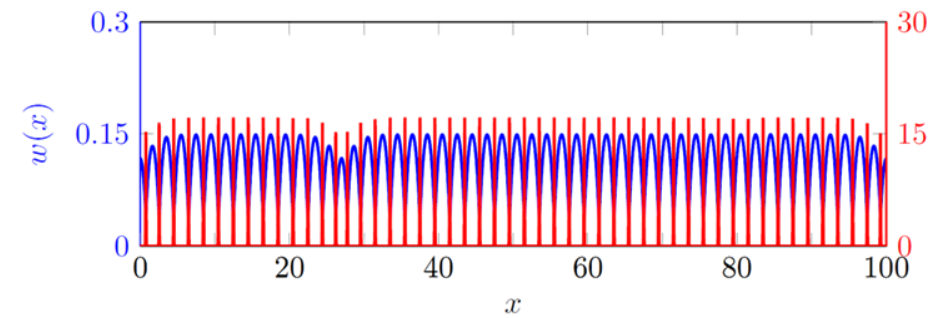
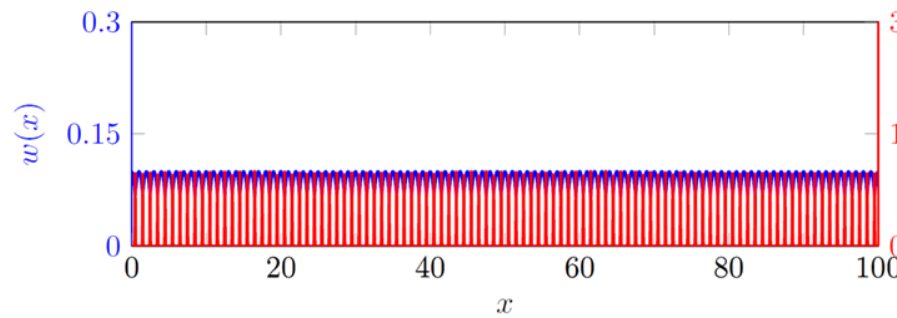
At bifurcation:

→ Location of structure changes

**2. FAST Pattern Degradation**

At bifurcation:

→ Structures created or destroyed





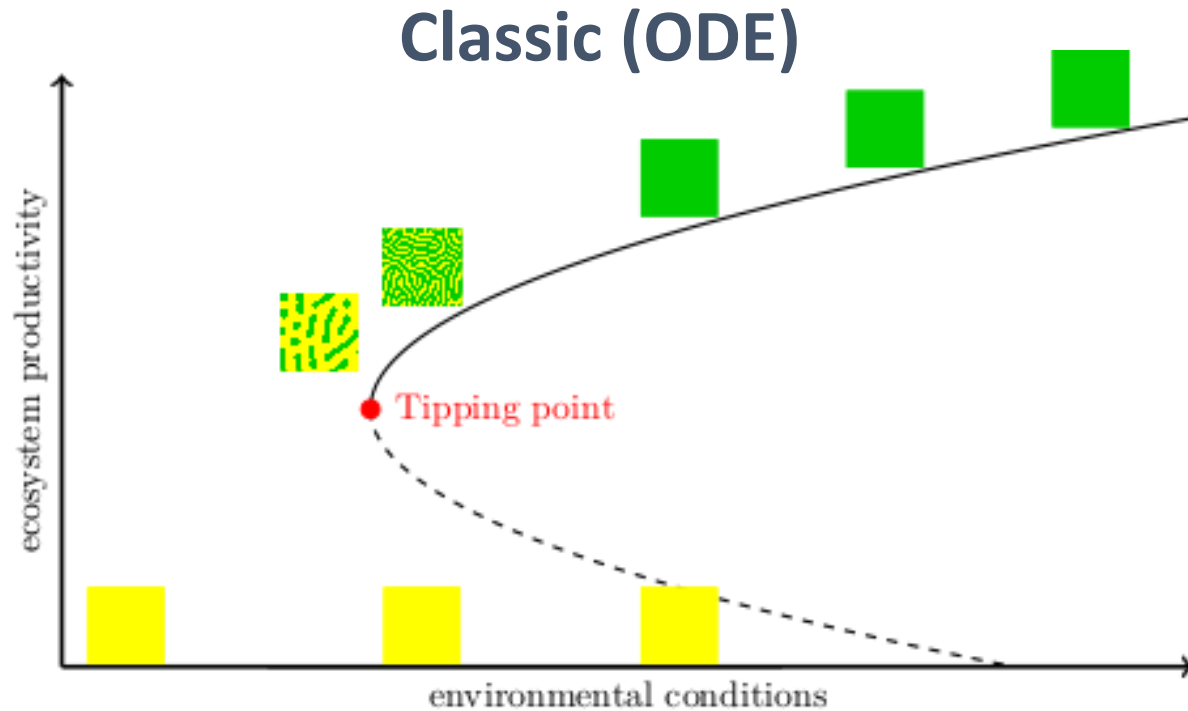


# Summary

# Tipping in Spatially Extended Systems

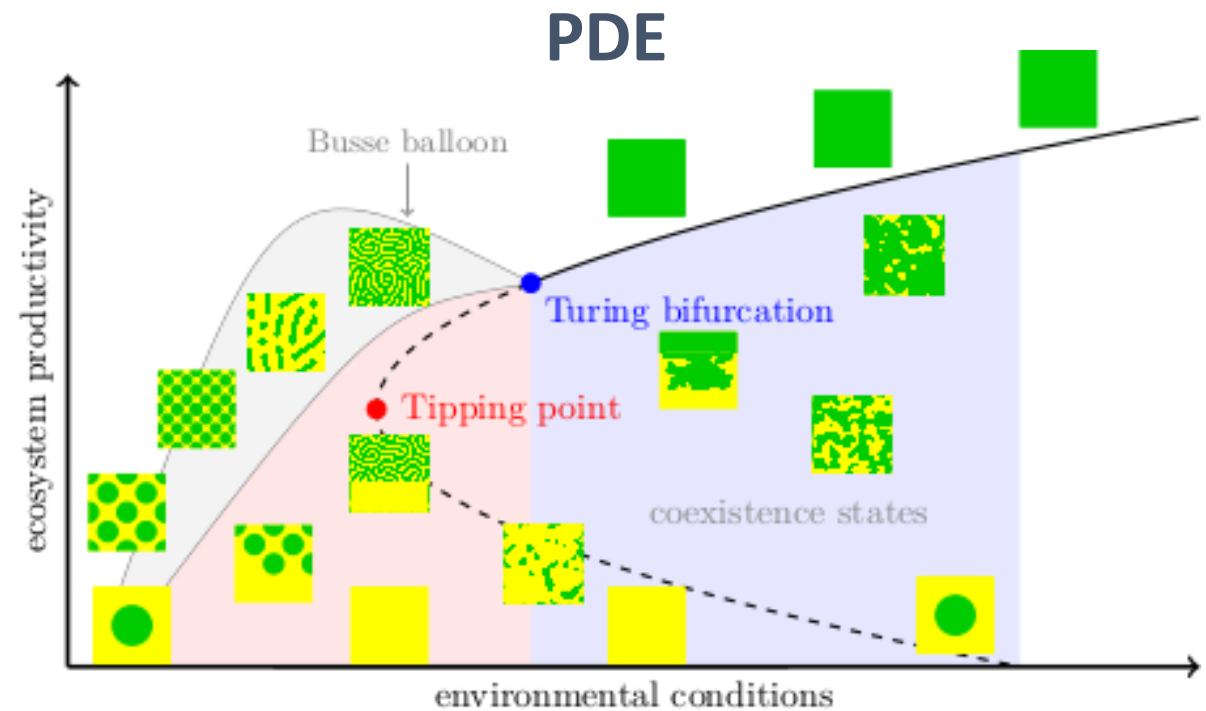


# What if the system tips?



Crossing a Tipping Point:  
→ Always full reorganization

**Early Warning Signals**  
signal for WHEN



Crossing a bifurcation:  
Now also possible:  
→ Spatial reorganization (Turing patterns)  
→ Fragmented tipping (coexistence states)

**Early Warning Signals**  
need to signal WHEN & WHAT

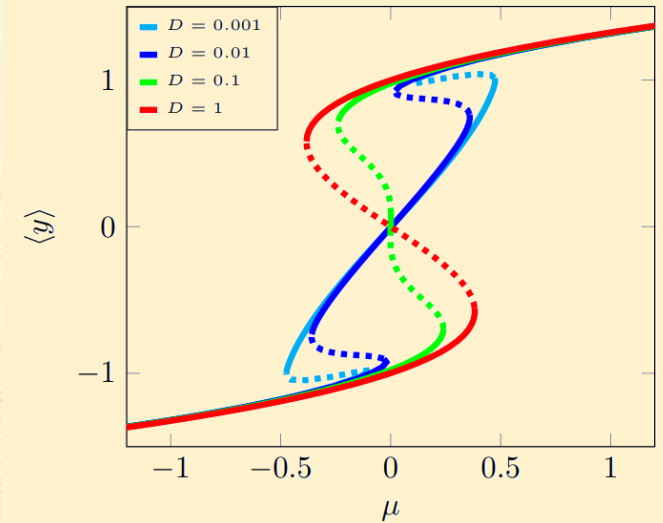
# Do systems always behave like this? (a.k.a. the small print)

No.

Well-mixed systems



Spatially confined systems



→ Such systems (again) behave like ODEs ←

But even in other systems terms & conditions apply:  
System-specific knowledge is required!



## Spatial Patterns:

🌀 Turing Patterns

🌀 Coexistence States

## Tipping can be more subtle:

📊 Spatial reorganization

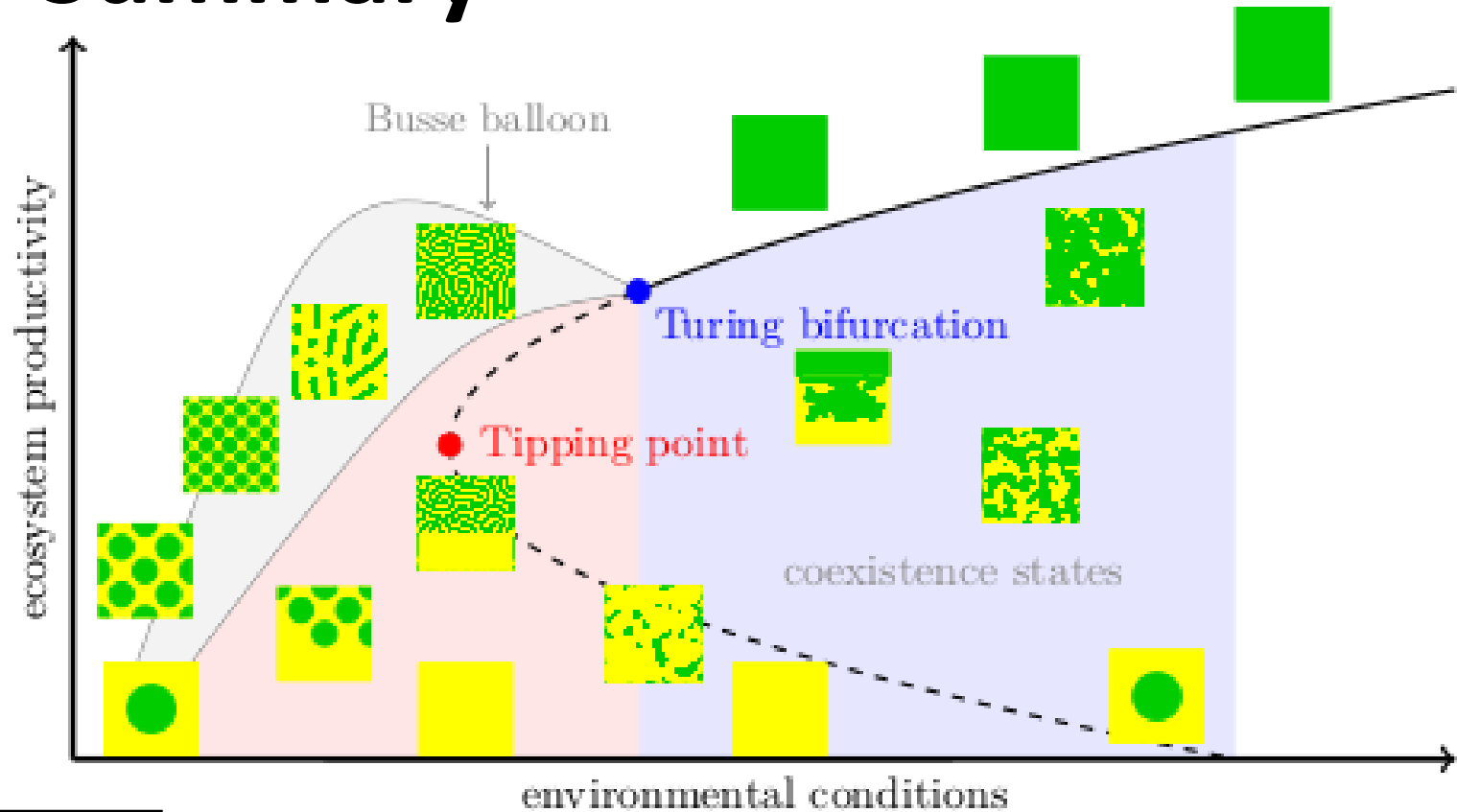
📊 Fragmented Tipping

## Dynamics of Patterns is:

🐢 Slow Pattern Adaptation

🐰 Fast Pattern Degradation

# Summary



### THANKS TO:

Swarnendu Banerjee

Mara Baudena

Alexandre Bouvet

Martina Chirilus-Bruckner

Vincent Deblauwe

Arjen Doelman

Henk Dijkstra

Maarten Eppinga

Anna von der Heydt

Olfa Jaïbi

Johan van de Koppel

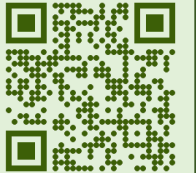
Stéphane Mermoz

Max Rietkerk

Eric Siero

Koen Siteur

Rietkerk, M., Bastiaansen, R., Banerjee, S., van de Koppel, J., Baudena, M., & Doelman, A. (2021). Evasion of tipping in complex systems through spatial pattern formation. *Science*, 374(6564), eabj0359.



Bastiaansen, R., Dijkstra, H. A., & von der Heydt, A. S. (2021). Fragmented Tipping in a spatially heterogeneous world. *Environmental Research Letters*, 17, 045006







