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# Tipping in Spatially Extended Systems

2021-12-16, MI Delft  
Robbin Bastiaansen

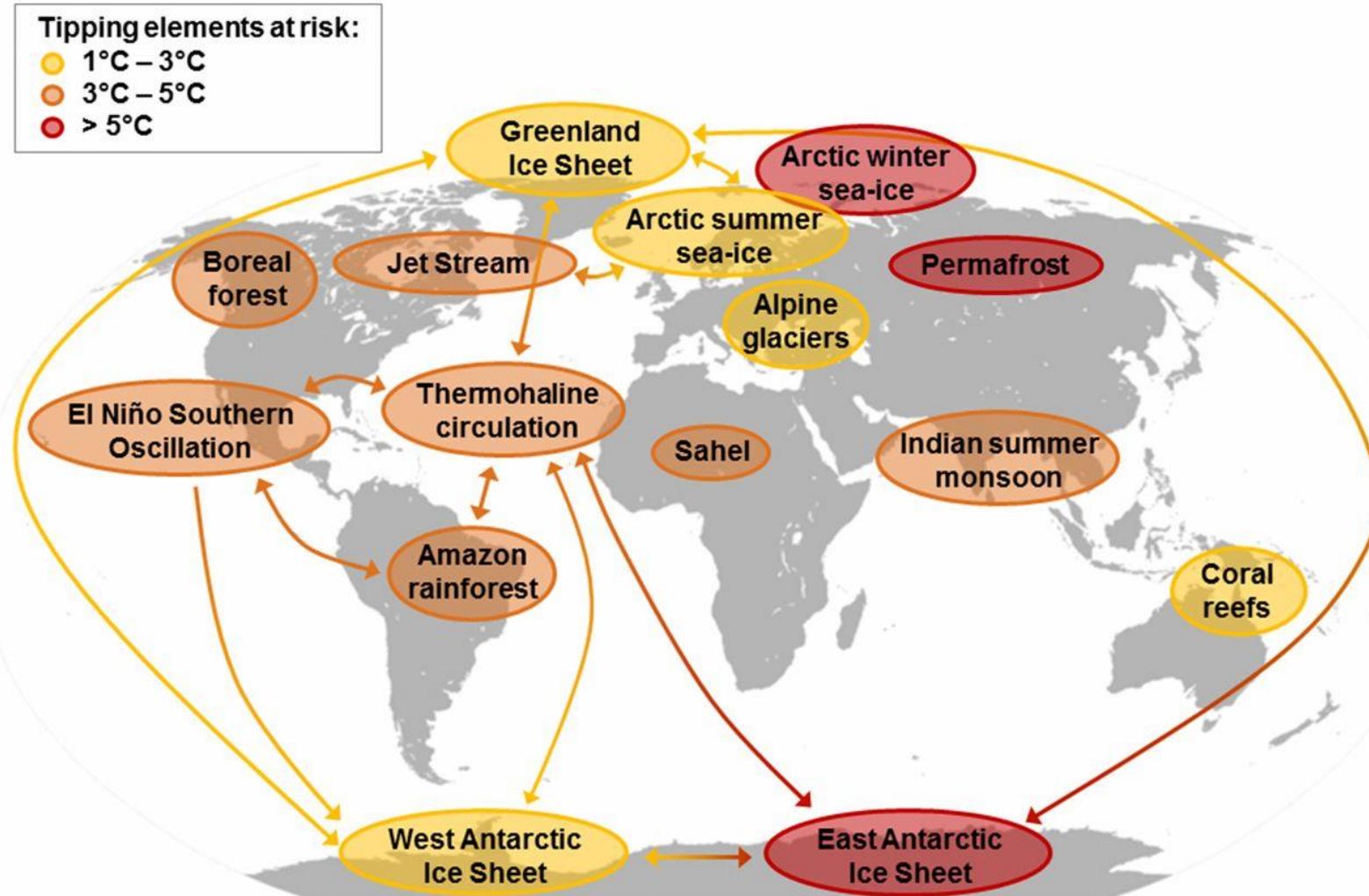


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COPENHAGEN



# Tipping Points

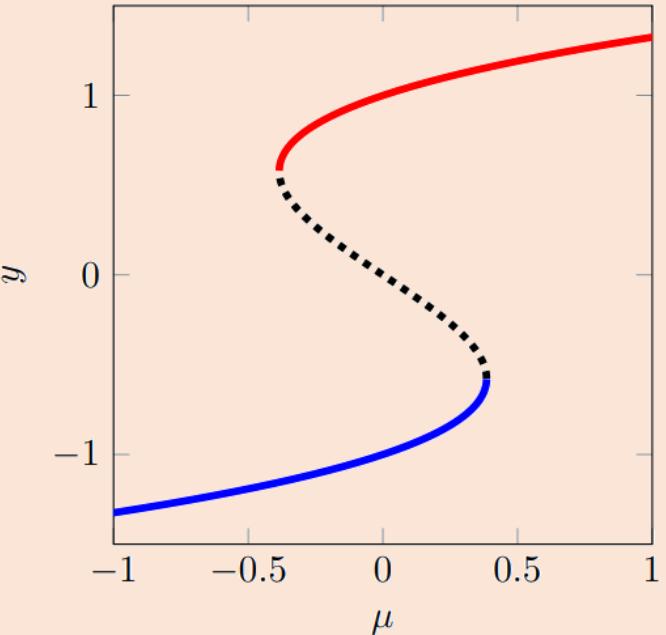
IPCC AR6 (2021) : “a critical threshold beyond which a system reorganizes, often abruptly and/or irreversibly”



## Mathematics

Tipping points  $\leftrightarrow$  Bifurcations

$$\frac{dy}{dt} = f(y, \mu)$$



What about spatially extended systems?

# Robbin Bastiaansen

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[bastiaansen.github.io](https://bastiaansen.github.io)

- Background in (Applied) Mathematics
  - 2015-2019:  
PhD @ Leiden University on *Pattern Formation and Desertification*  
*(with Arjen Doelman, Martina Chirilus-Bruckner & Max Rietkerk)*
  - Since JAN 2020:  
PostDoc @ IMAU, Utrecht University on *Climate Sensitivity and Response*  
*(with Anna von der Heydt & Henk Dijkstra)*
- Work within H2020 project TiPES: Tipping Points in the Earth System

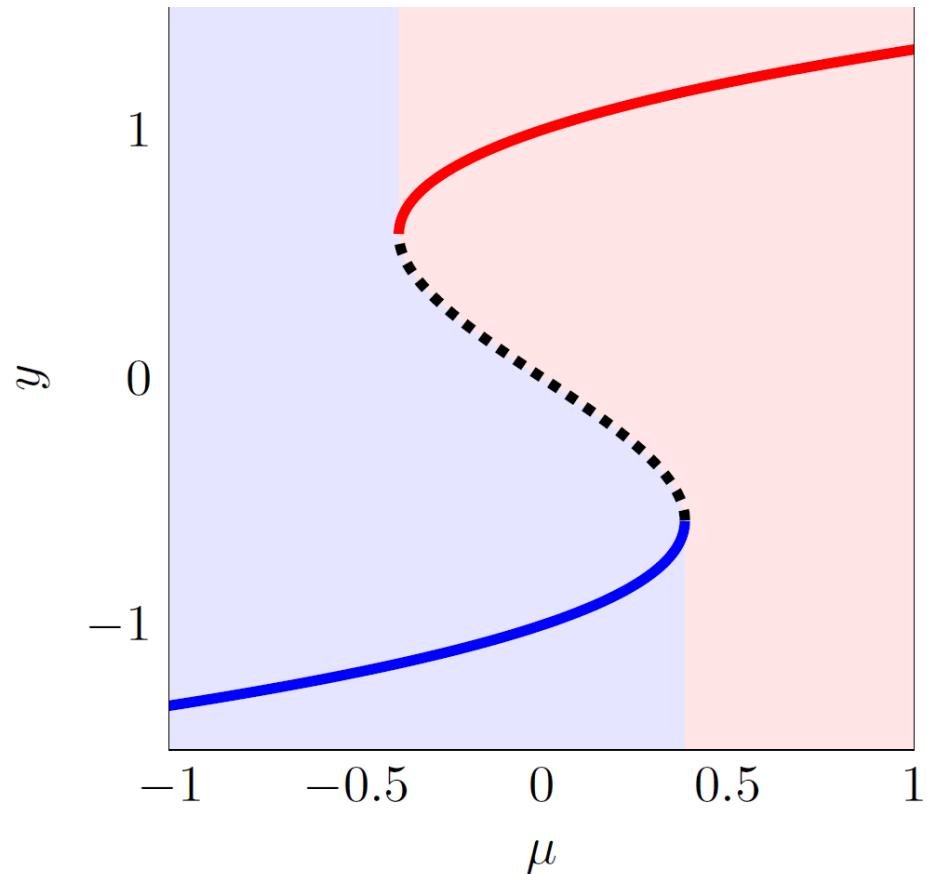


# Part 0: Tipping in ODEs

# Tipping in ODEs (1)

**Canonical example:**

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



Concrete example: Global Energy Balance Model

$$\frac{dT}{dt} = Q(1 - \alpha(T)) - \varepsilon\sigma_0 T^4 + \mu$$

**Classic Literature**

- [Holling, 1973]
- [Noy-Meier, 1975]
- [May, 1977]

**Tipping**

[Ashwin et al, 2012]

**Bifurcation-Tipping :** Basin disappears

**Noise-Tipping :** Forced outside Basin

**Rate-Tipping :** *(more complicated)*

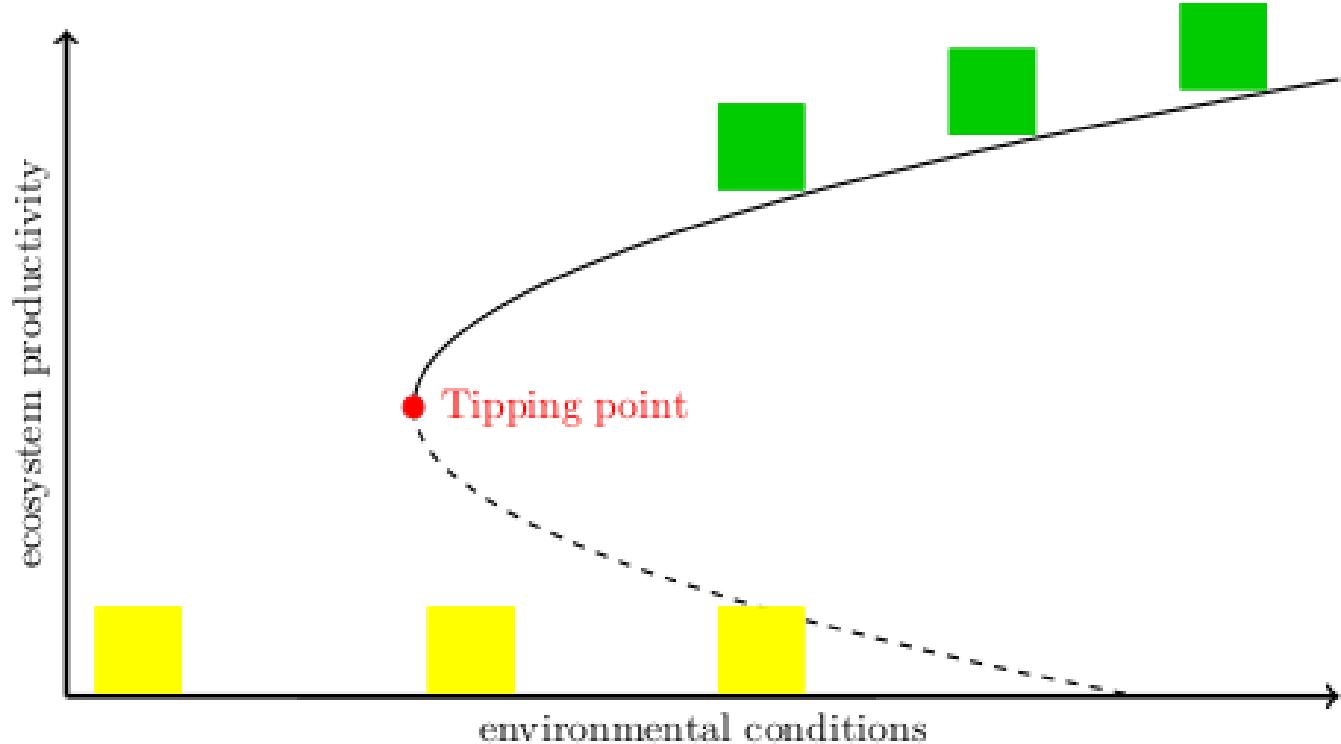
# Tipping in ODEs (2)

Two components:

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

includes common models:

- Predator-Prey
- Activator-Inhibitor



Examples of tipping in ODEs include:

- Forest-Savanna bistability
- Deep ocean exchange
- Cloud formation
- Ice sheet melting
- Turbidity in shallow lakes



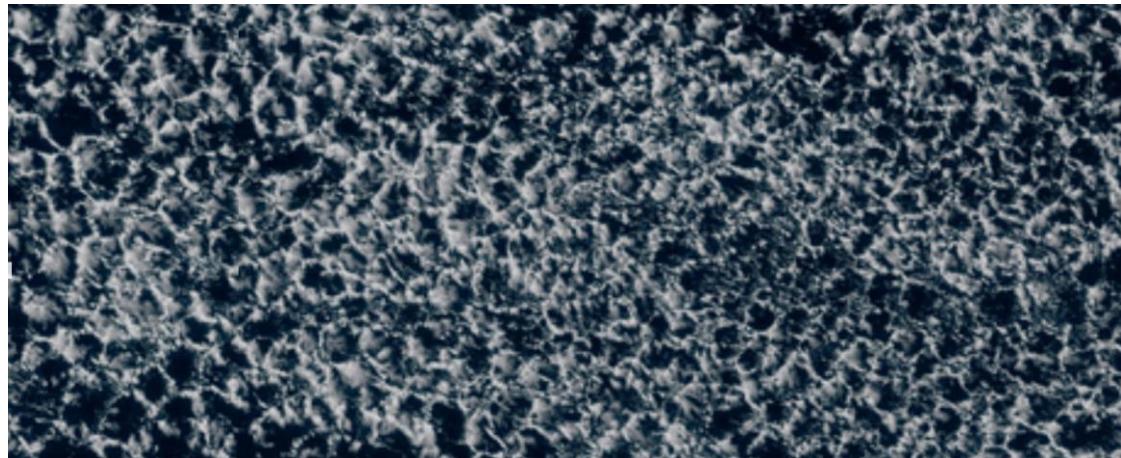
An aerial photograph of a vast, open landscape, likely a savanna or coastal plain. The terrain is covered in a light brown or tan color, with numerous small, dark green, rounded shrubs scattered across it. These shrubs are arranged in a roughly rectangular grid, creating a distinct pattern. In the upper right corner, there is a larger, more dense cluster of vegetation.

# Part 1: Turing Patterns

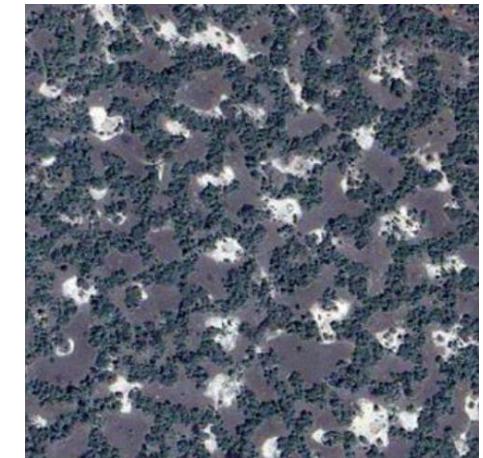
# Examples of spatial Patterning



mussel beds



clouds



savannas



melt ponds



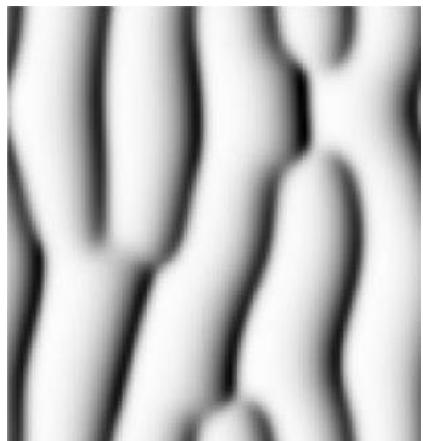
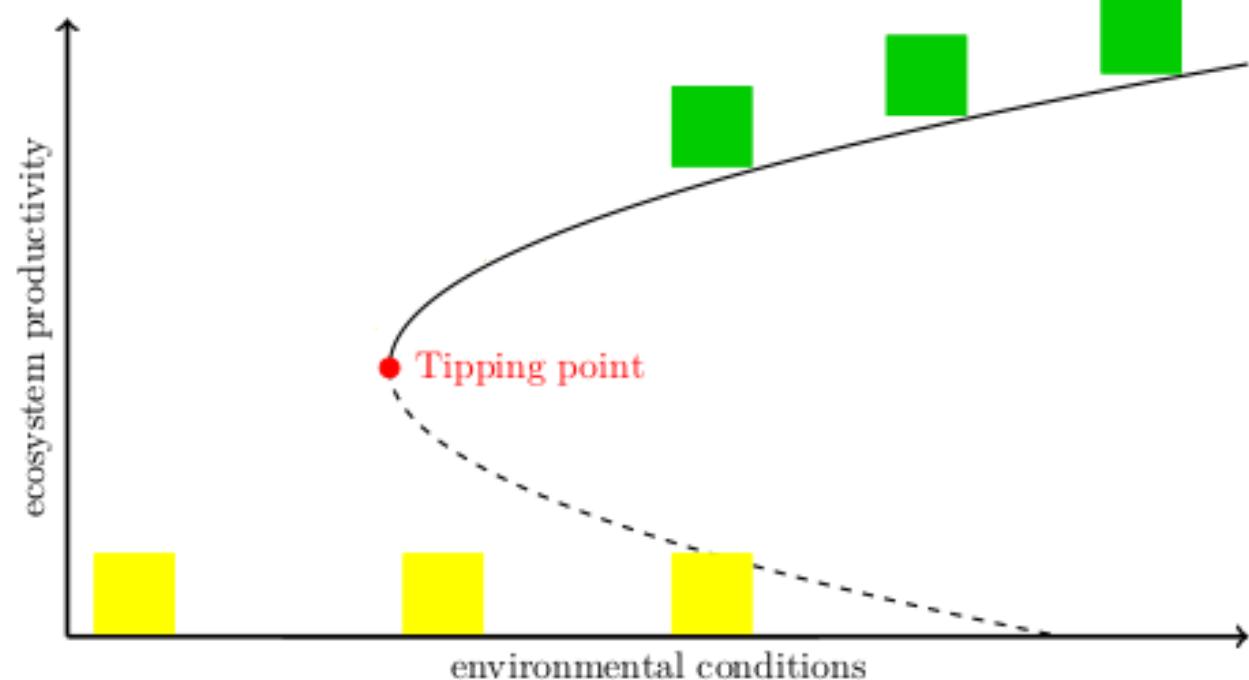
drylands

# Patterns in models

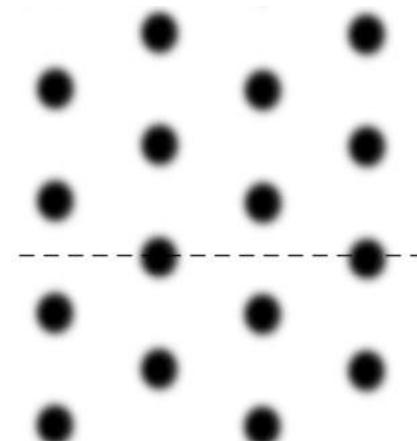
Add spatial transport:

Reaction-Diffusion equations:

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



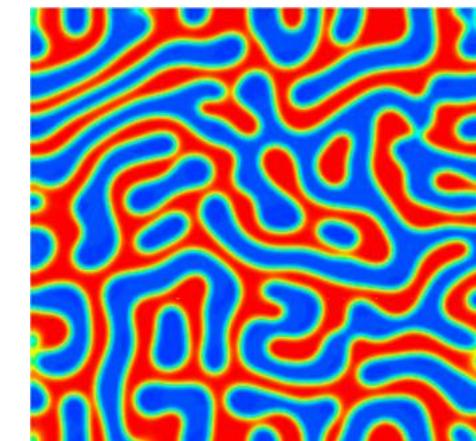
[Klausmeier, 1999]



[Gilad et al, 2004]

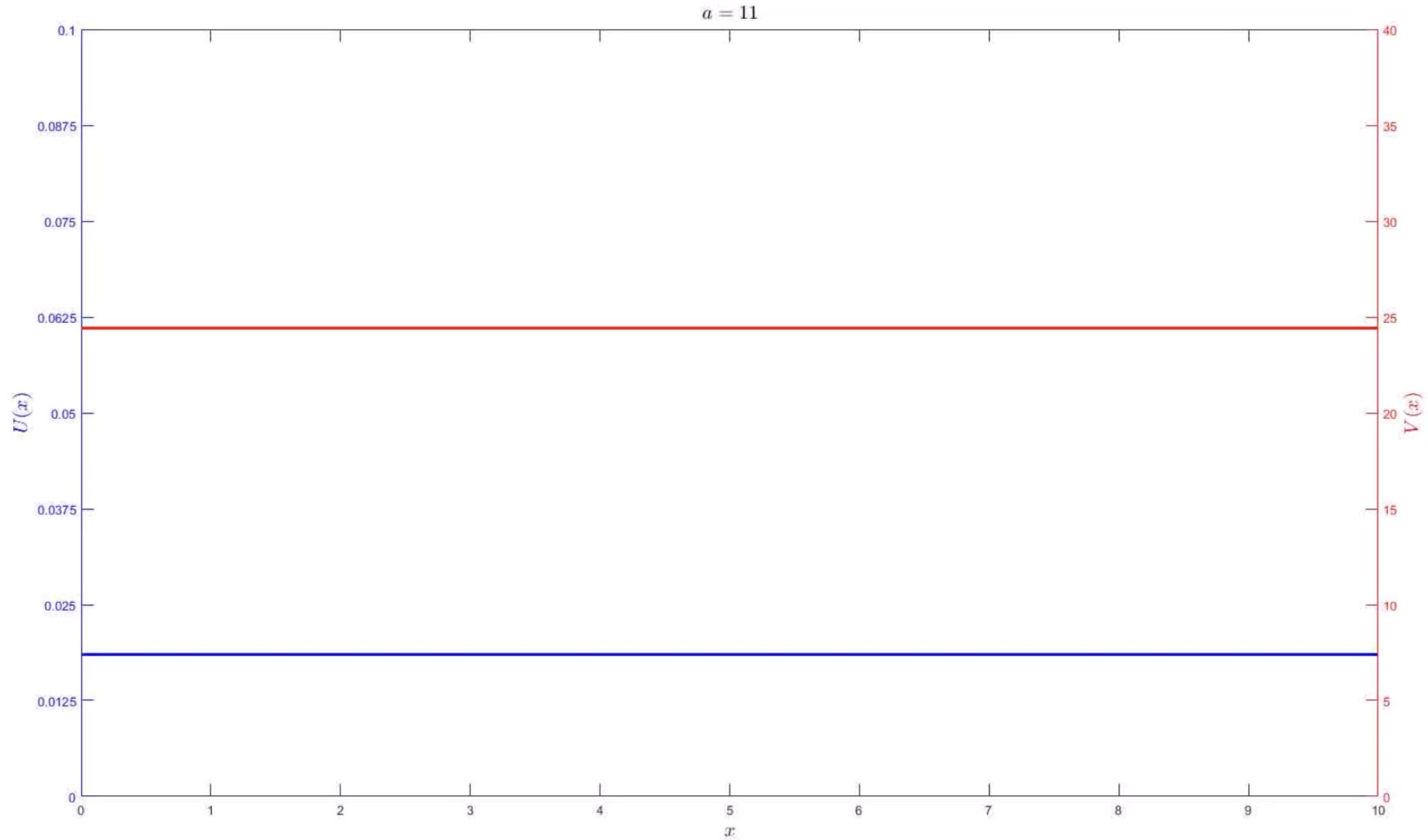


[Rietkerk et al, 2002]



[Liu et al, 2013]

# Behaviour of PDEs



# Turing patterns

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

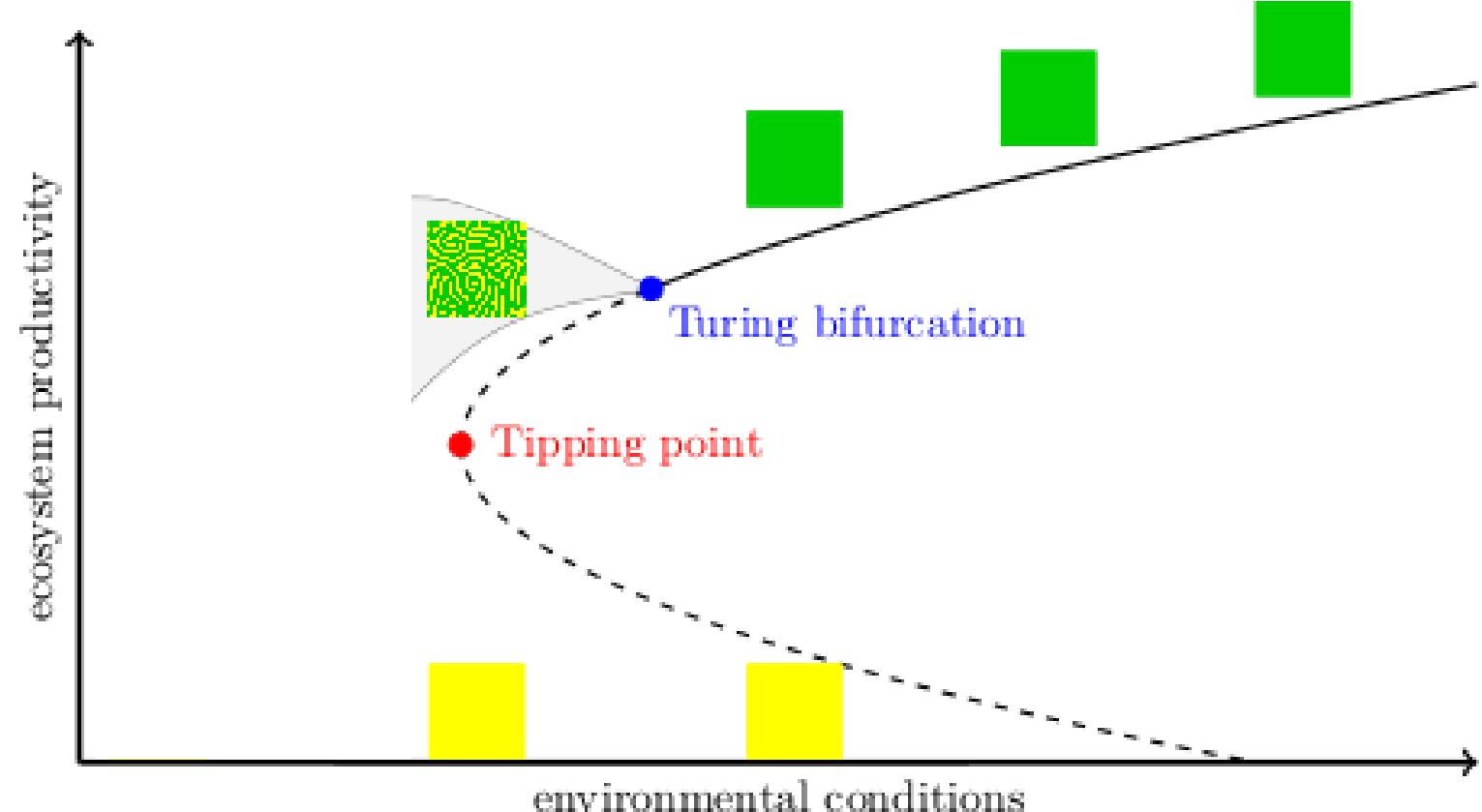
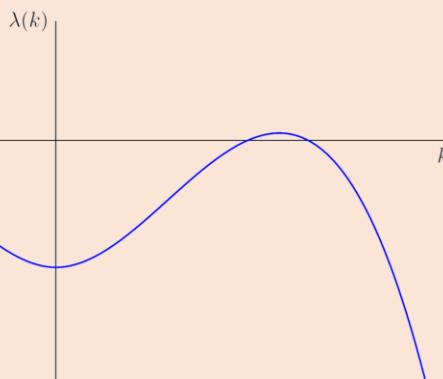
## Turing bifurcation

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

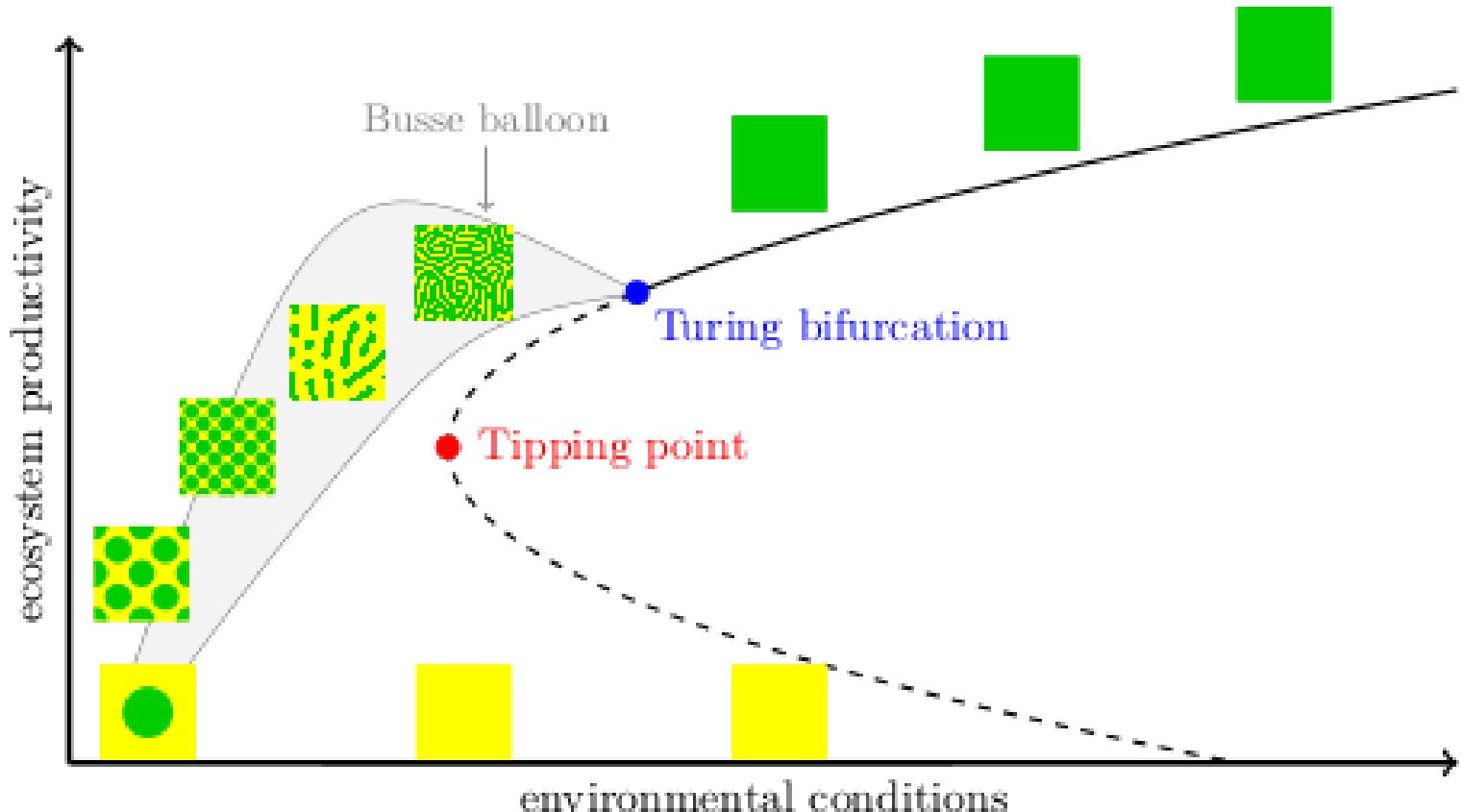
## Busse balloon

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

### Construction Busse balloon

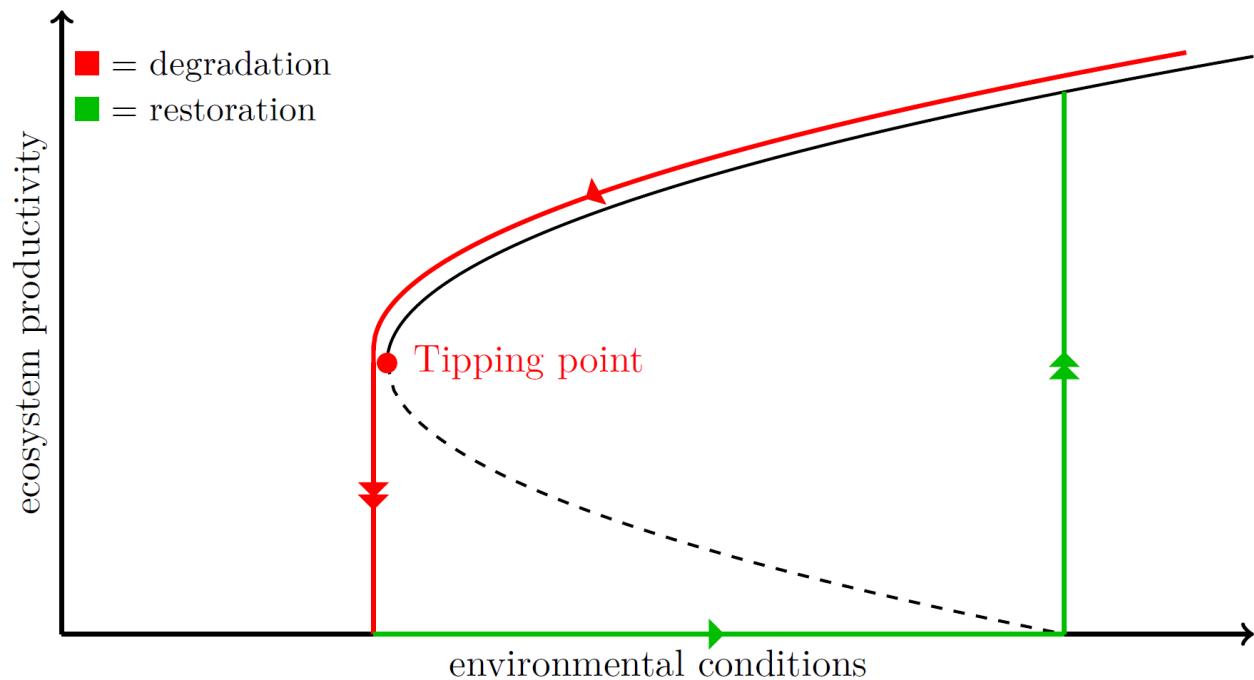
Via numerical continuation  
few general results on the  
shape of Busse balloon

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

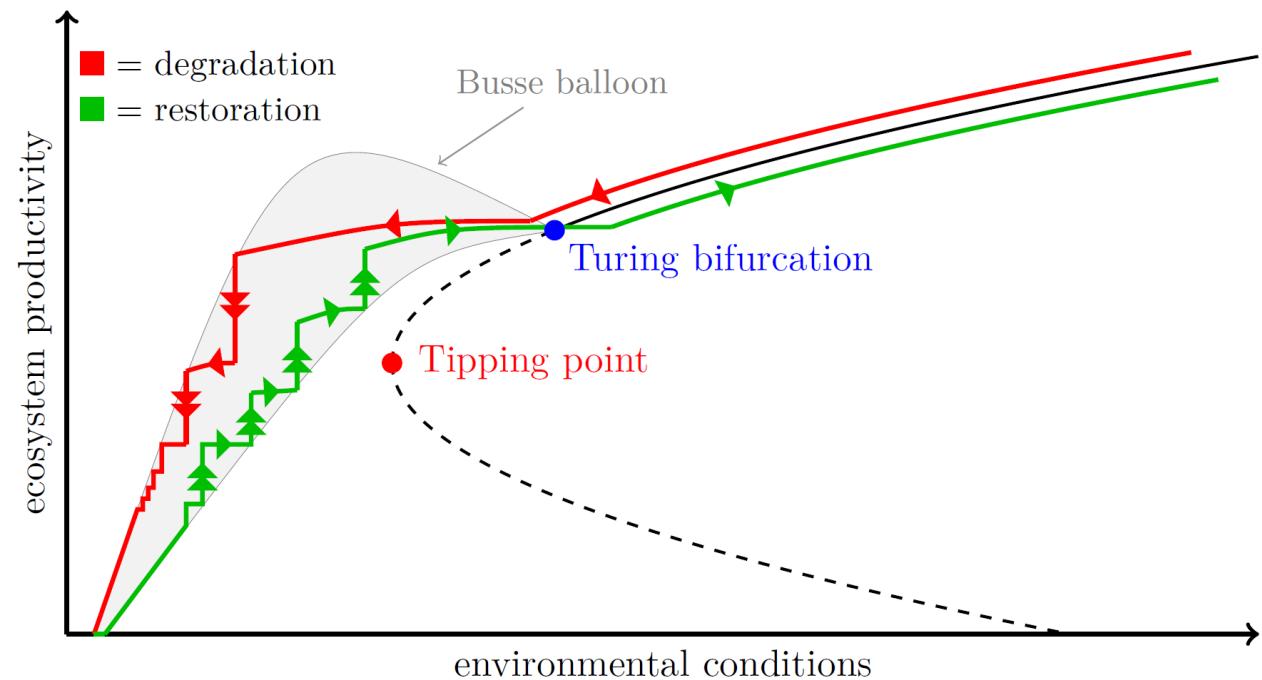


**Busse balloon**  
Idea originates from thermal convection  
[Busse, 1978]

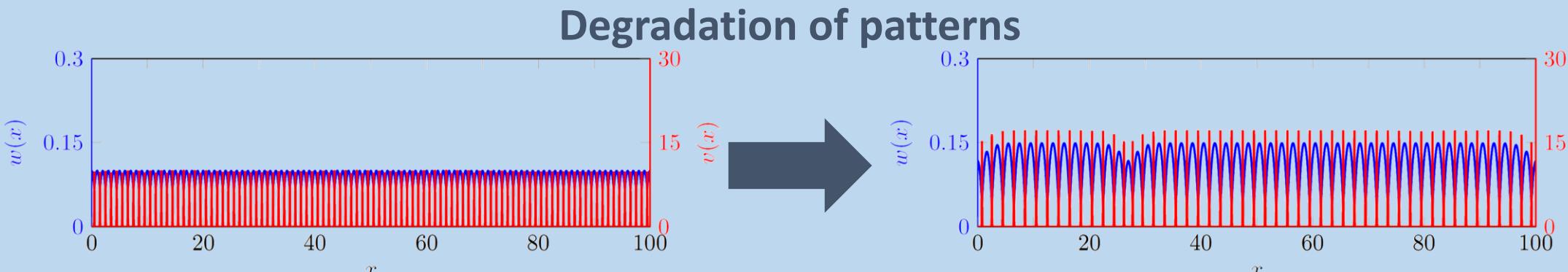
# Tipping of (Turing) patterns



Classic tipping



Tipping of patterns



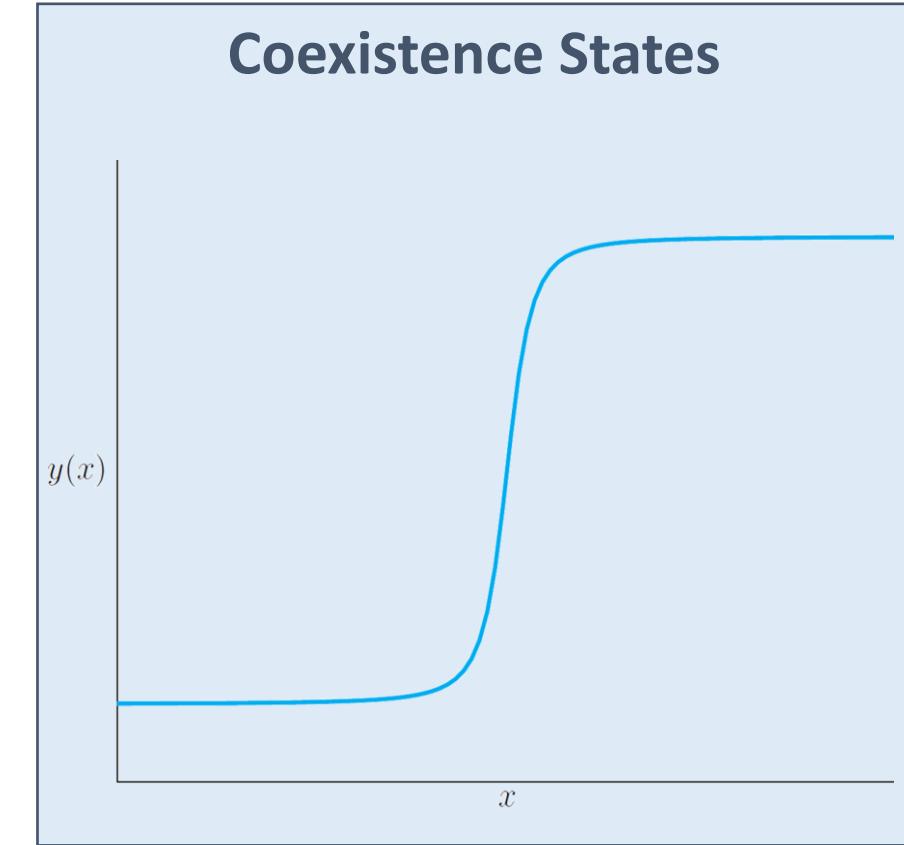
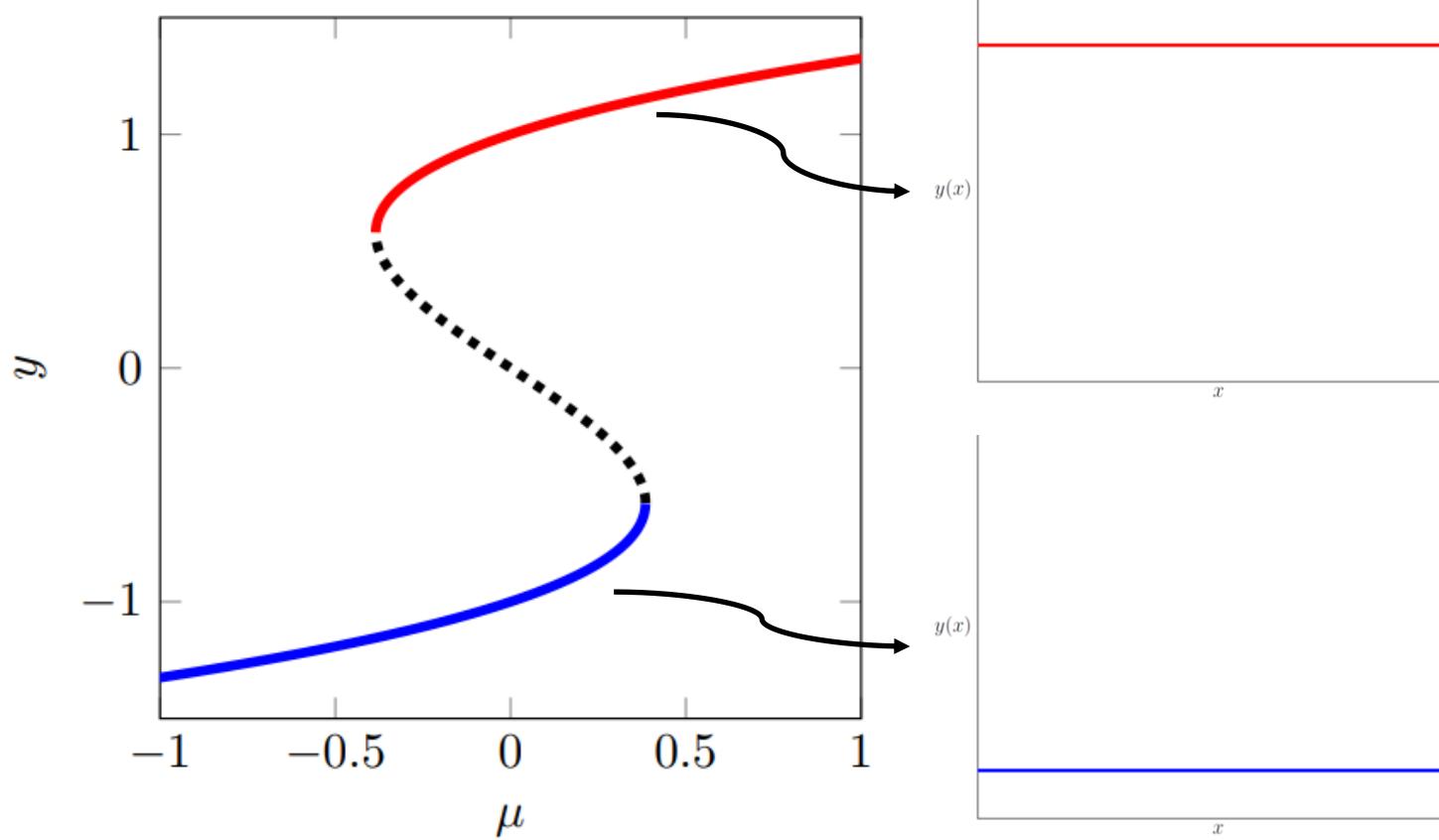


# Part 2: Coexistence States and spatial heterogeneities

# Coexistence states

Bistable (Allen-Cahn/Nagumo) equation:

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



# Examples of Coexistence States

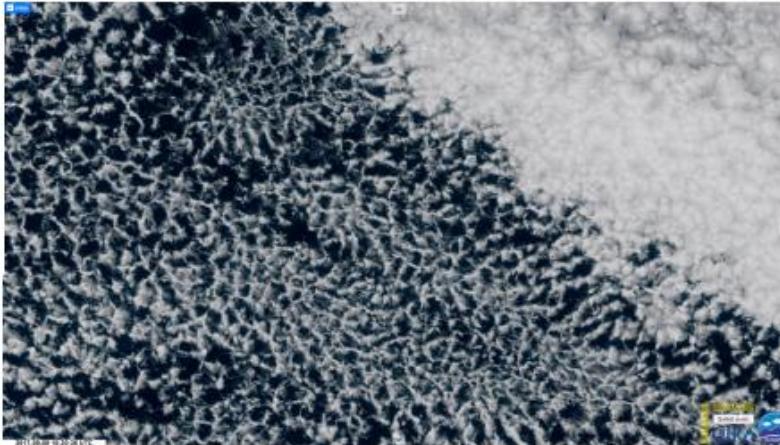
tropical forest  
& savanna  
ecosystems

[Google Earth]



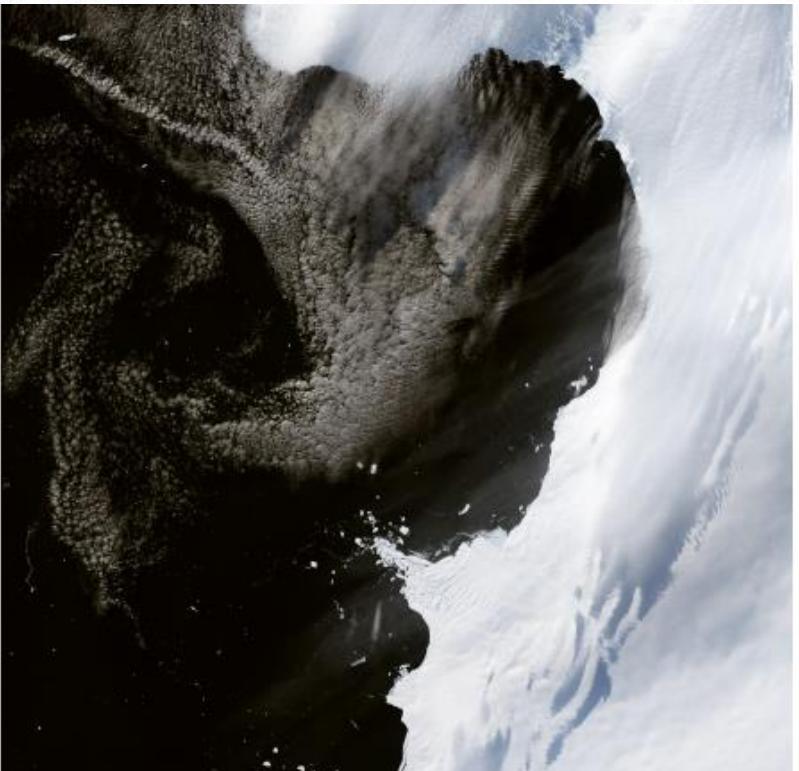
types of  
stratocumulus  
clouds

[RAMMB/CIRA SLIDER]



sea-ice & water  
at Eltanin Bay

[NASA's Earth observatory]

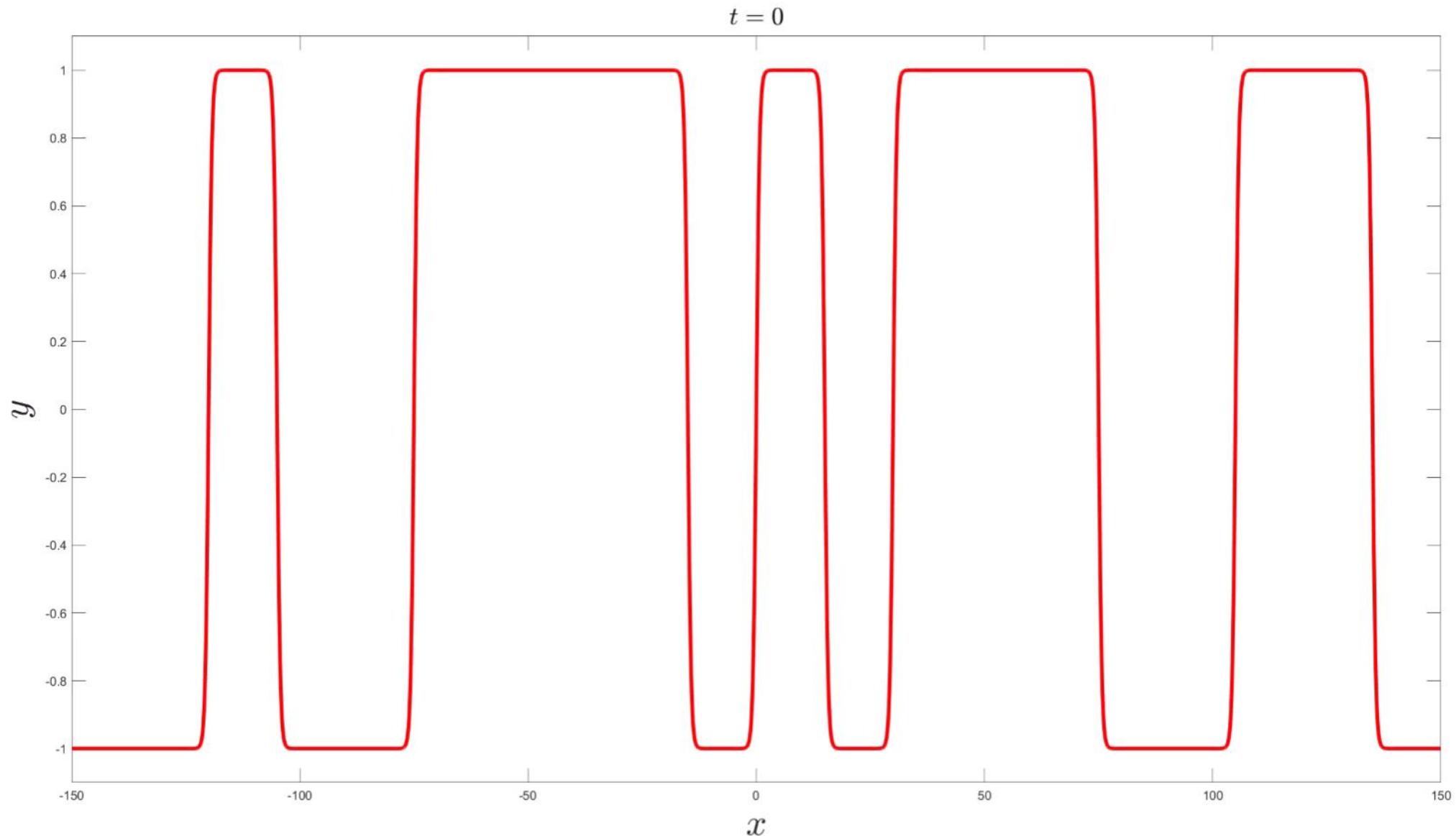


algae bloom  
in Lake St. Clair

[NASA's Earth observatory]



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

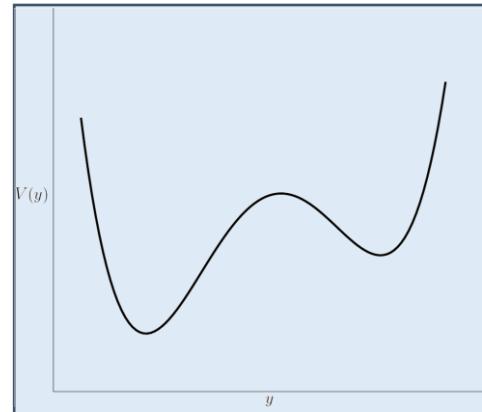


# Front Dynamics

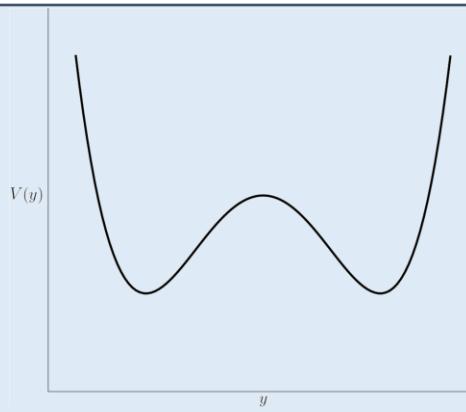
$$\frac{\partial y}{\partial t} = D \frac{\partial^2 y}{\partial x^2} + f(y; \mu)$$

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

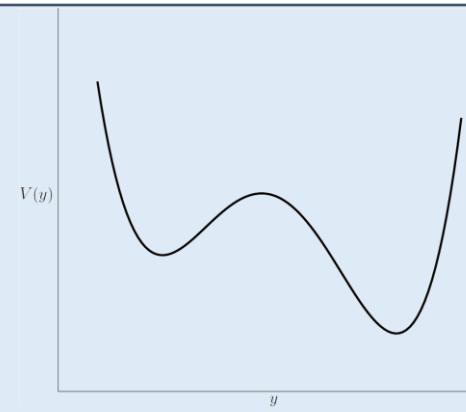
$$\frac{\partial V}{\partial y}(y; \mu) = -f(y; \mu)$$



moves left

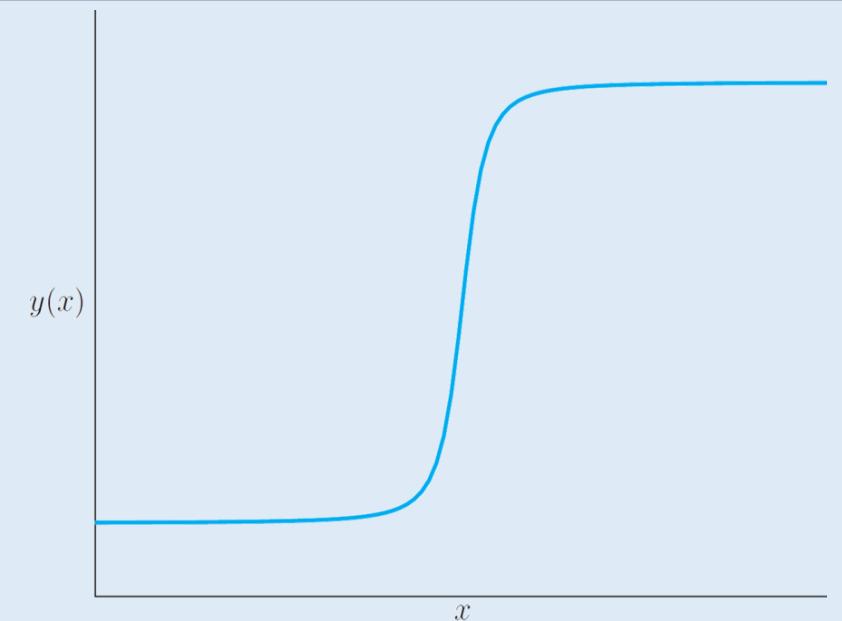
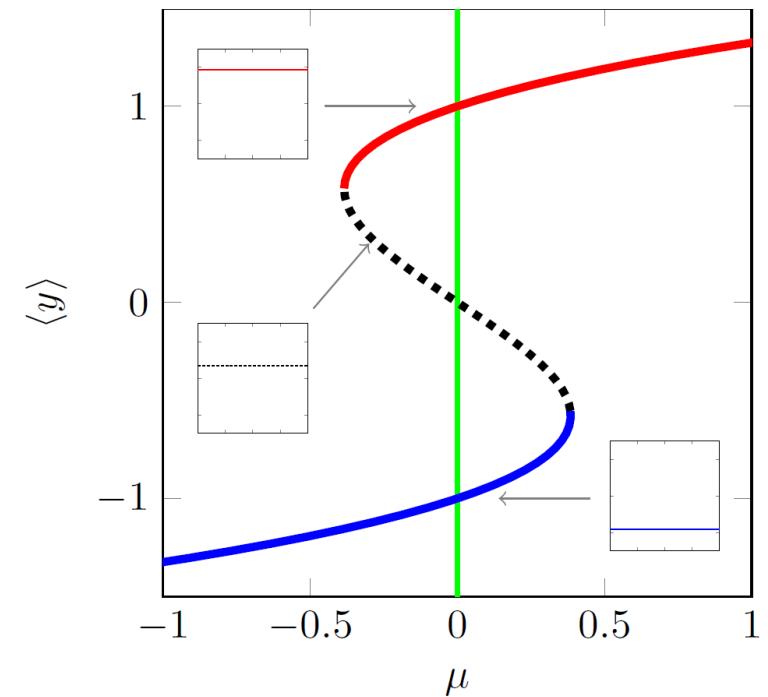


stationary



moves right

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

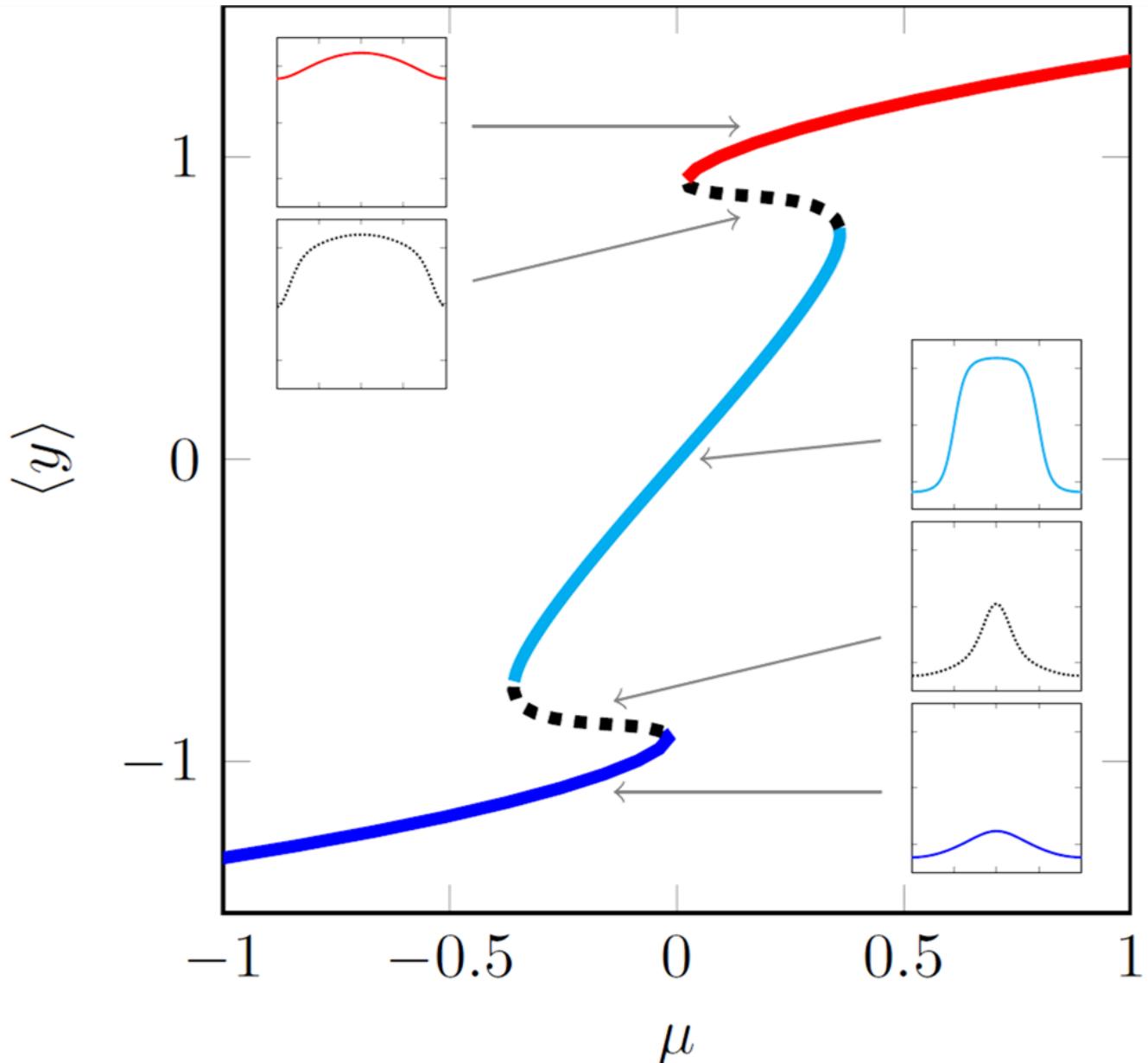


# Adding Spatial Heterogeneity

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

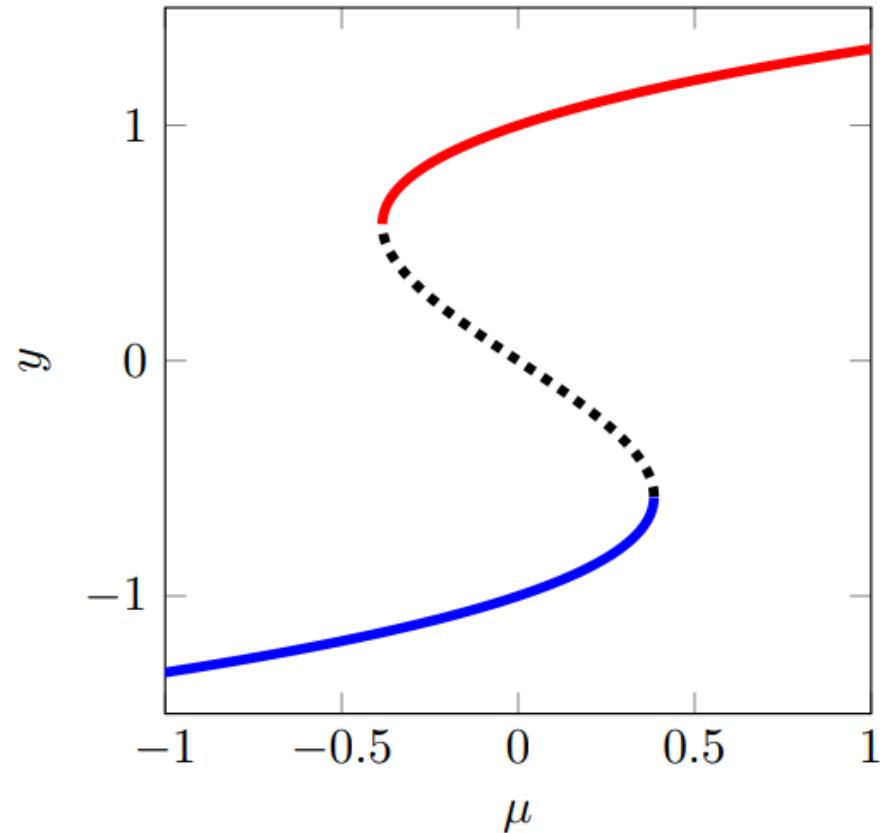
Now, the **local** difference in potentials determines the front movement

- New behaviour:
- Multi-fronts can be stationary
  - Maxwell point is smeared out



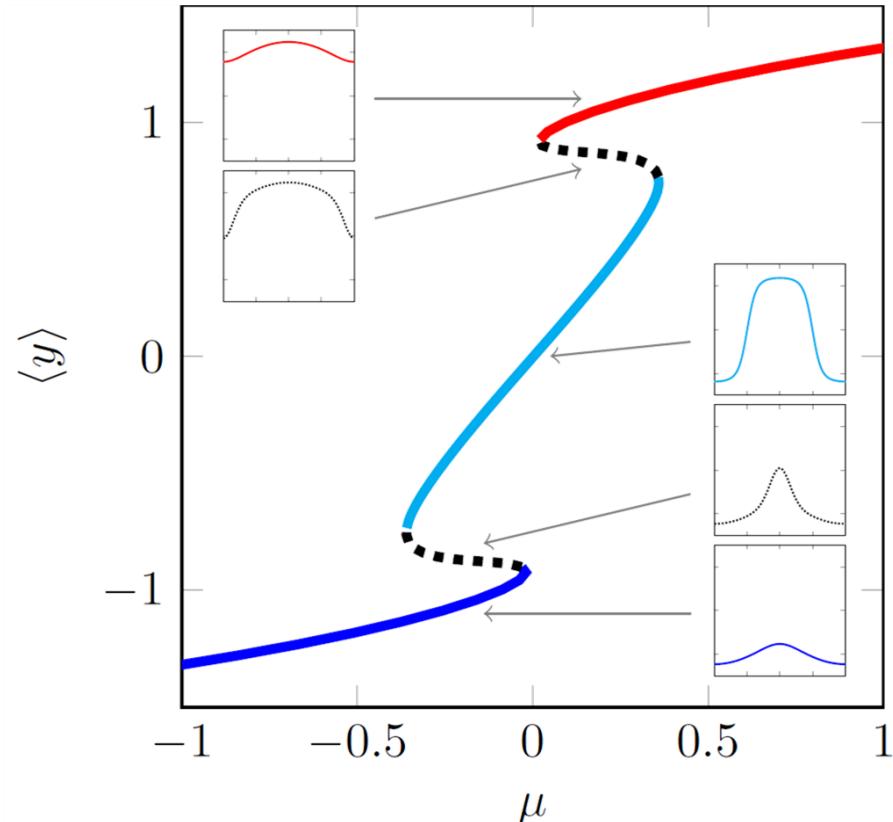
# Partial Tipping

Classic (ODE)



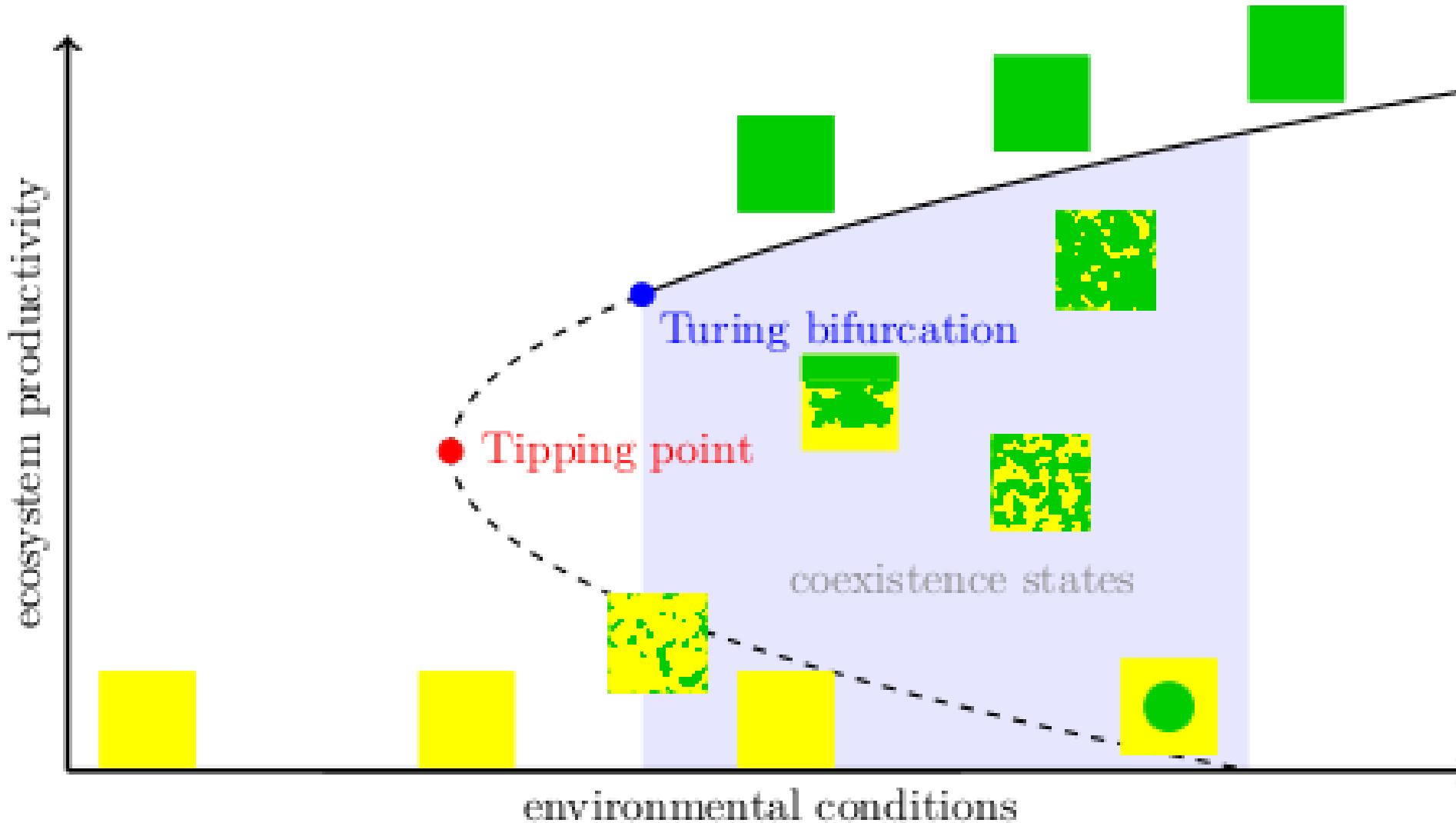
Tipping leads to full reorganisation

Heterogeneous PDE



Partial tipping events possible:  
Only part of the domain reorganises

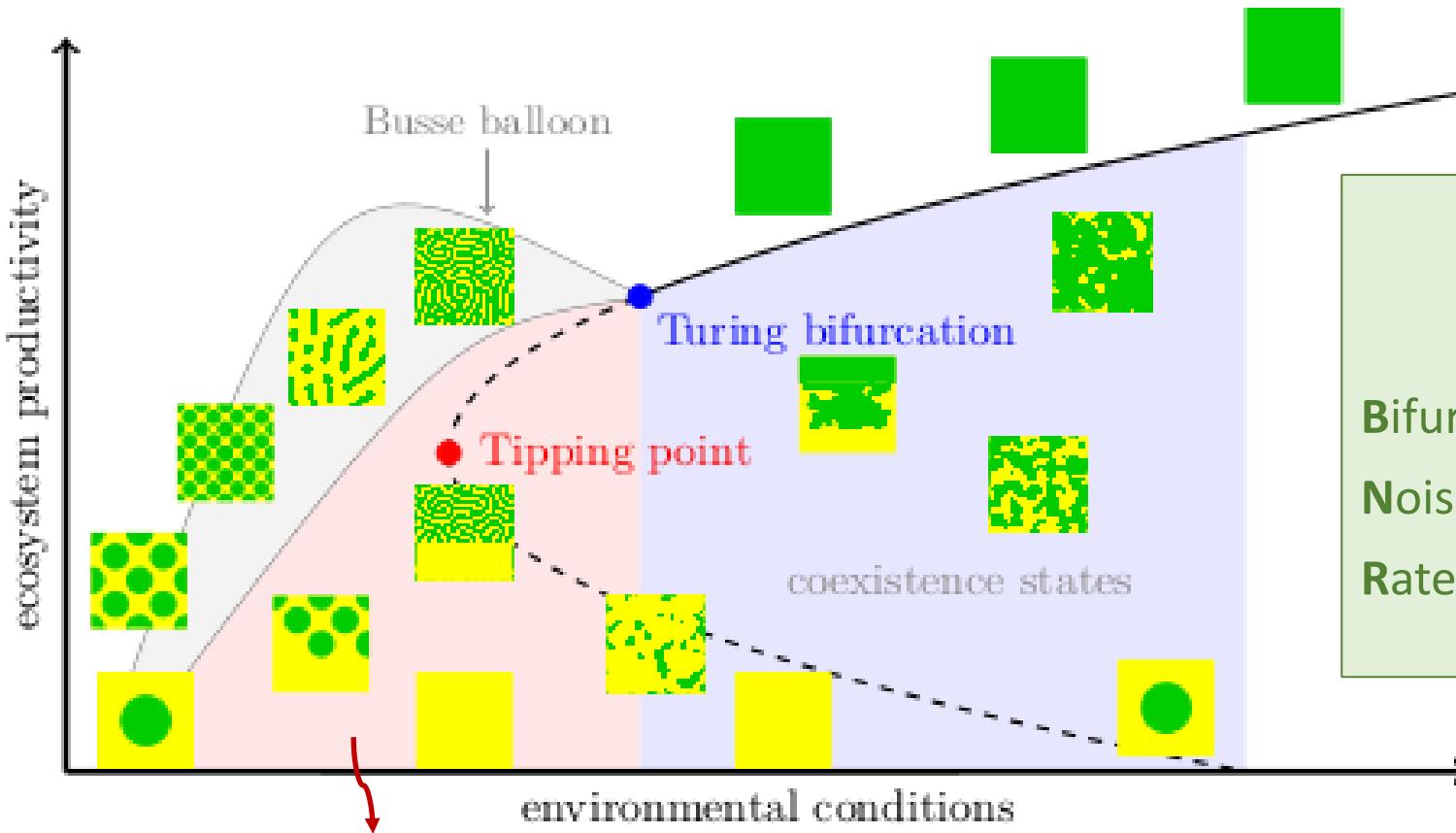
# Coexistence states in bifurcation diagram



An aerial photograph of a grassland fire on a hillside. The fire is visible as a bright orange line where it has recently passed through, contrasting with the dark, charred remains of the vegetation. The hillside slopes upwards from left to right, with the burning area occupying the lower, flatter portion. The surrounding terrain is covered in dry, yellowish-green grass. A thin white smoke plume rises from the fire's edge.

# Part 3: Tipping in Spatially Extended Systems

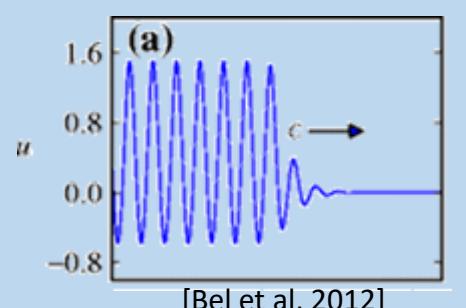
# “Bifurcation Diagram” for spatially extended systems



**Tipping**  
[Ashwin et al, 2012]

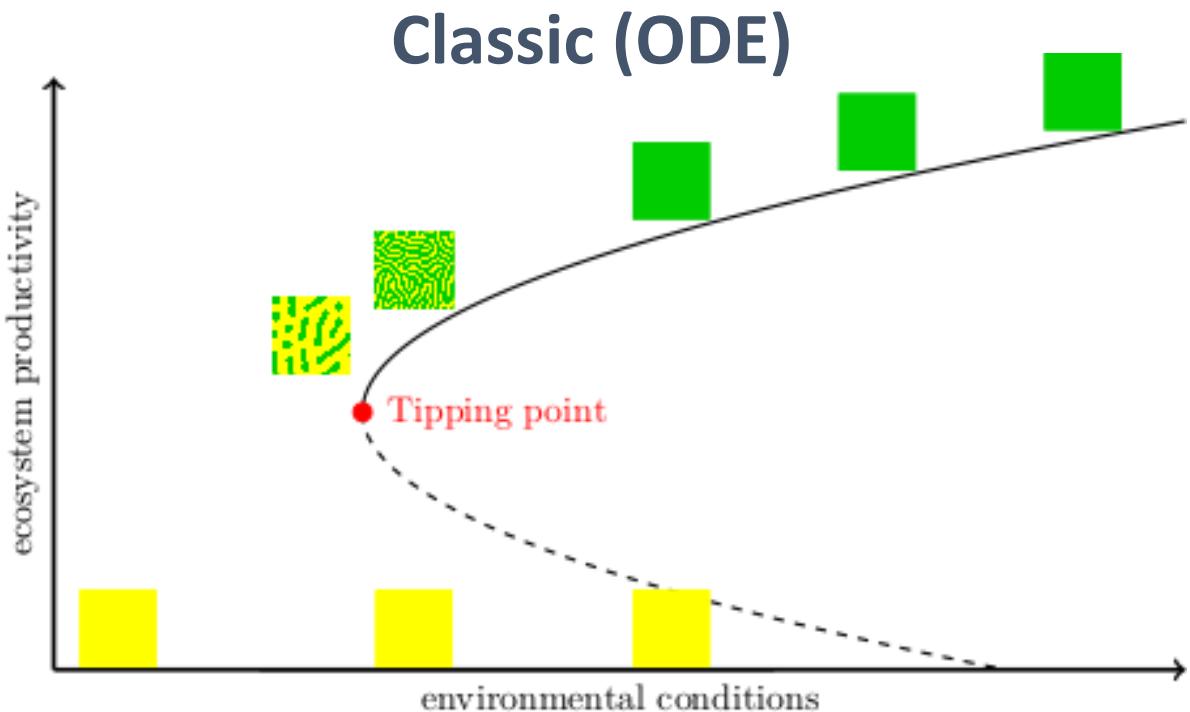
- Bifurcation-Tipping : Basin disappears
- Noise-Tipping : Forced outside Basin
- Rate-Tipping : (more complicated)

Coexistence states  
between patterned and  
uniform states also exist



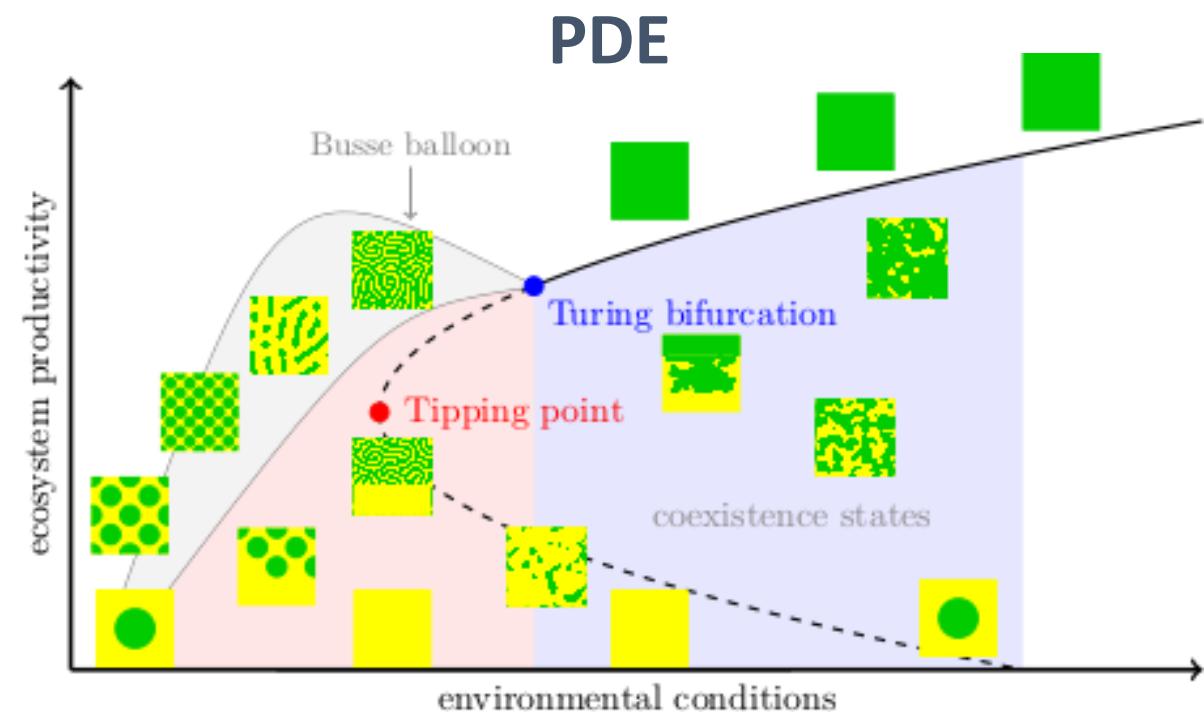
[Bel et al, 2012]

# 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)  
→ Partial Tipping (coexistence states)

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

# Do systems always behave like this?

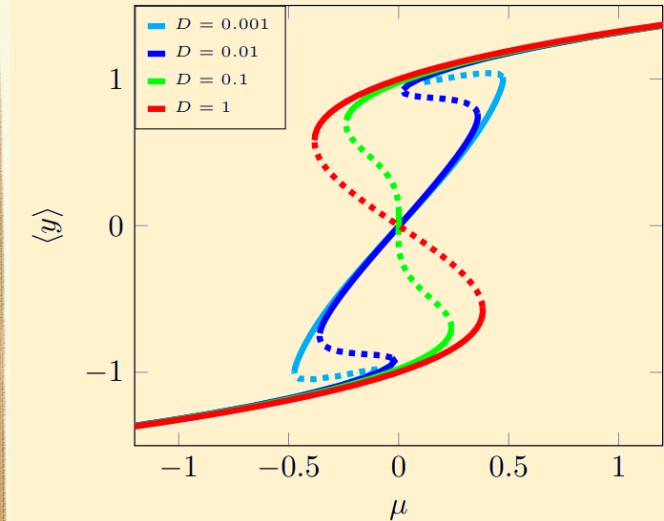
(a.k.a. the small print)

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!

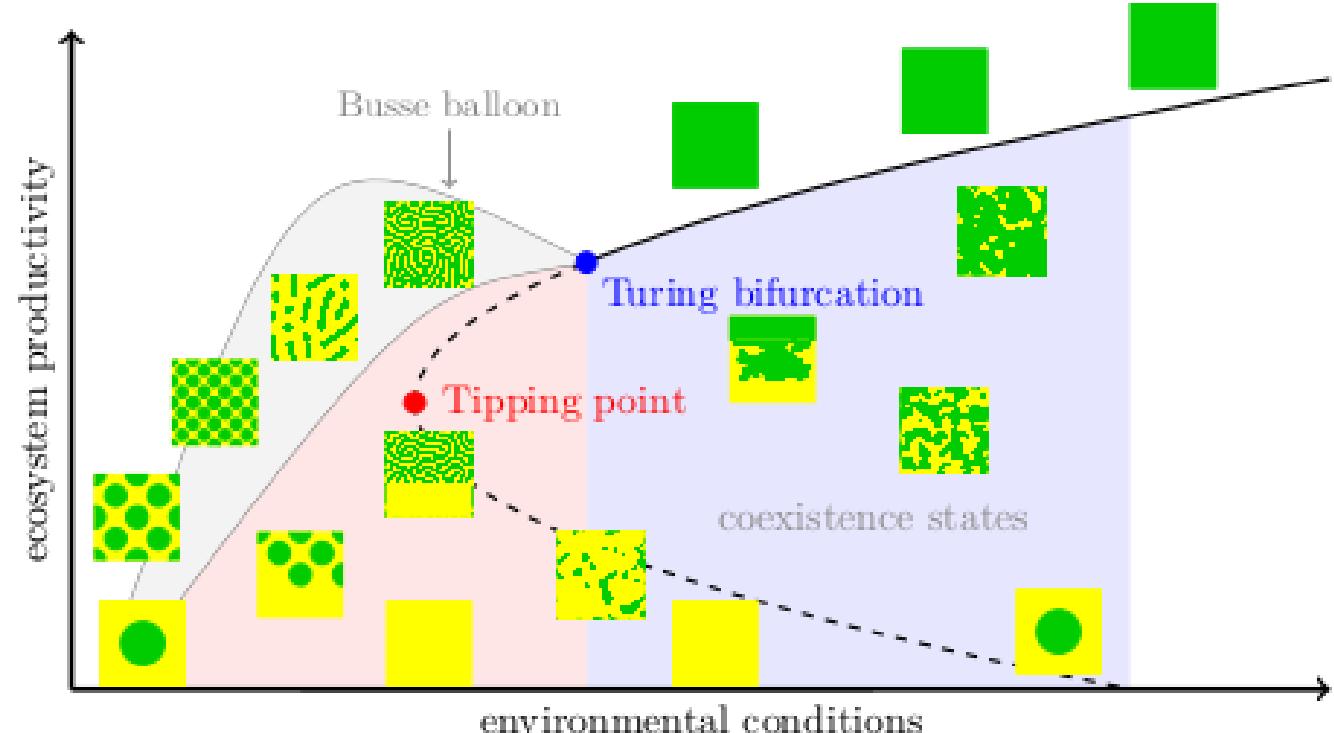
# Summary

PDE dynamics richer:

- ❖ Turing Patterns
- ❖ Coexistence States

Tipping can be more subtle:

- ❖ Spatial reorganization
- ❖ Partial Tipping



## THANKS TO:

Swarnendu Banerjee	Mara Baudena	Alexandre Bouvet
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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). **Partial tipping in a spatially heterogeneous world.** *arXiv preprint arXiv:2111.15566*.

