



Heriot-Watt University &  
The University of Edinburgh



# Spatial self-organisation enables species coexistence in a model for dryland vegetation

DSABNS, February 2020

Slides are available on my website.  
<http://www.macs.hw.ac.uk/~le8/>

*Lukas Eigentler*

*joint work with Jonathan A Sherratt (Heriot-Watt Univ.)*



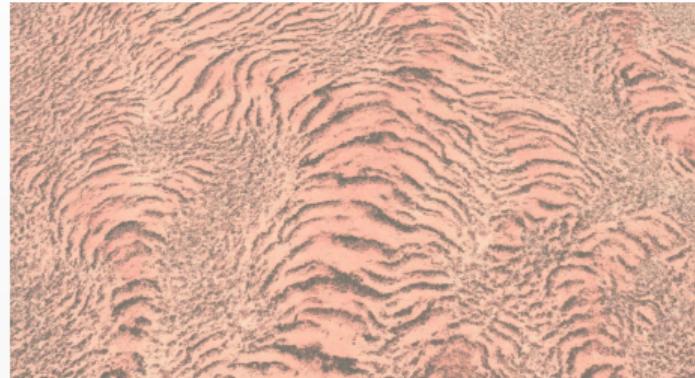
# Vegetation patterns

Vegetation patterns are a classic example of a **self-organisation principle** in ecology.

Vegetation band in Australia.<sup>1</sup>



Stripe pattern in Ethiopia<sup>2</sup>.



- Plants increase water infiltration into the soil and induce a **positive feedback loop**.
- On sloped ground, stripes grow **parallel to the contours**.

<sup>1</sup>Dunkerley, D.: *Desert* 23.2 (2018).

<sup>2</sup>Source: Google Maps

# Vegetation patterns

Transition from vegetation patterns to **arid savannas** along the precipitation gradient.

Vegetation pattern.<sup>3</sup>



Arid savanna.<sup>4</sup>



- Both vegetation patterns and arid savannas are characterised by **species coexistence**.

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<sup>3</sup>Dunkerley, D.: *Desert* 23.2 (2018).

<sup>4</sup>Source: Wikimedia Commons

# Klausmeier model

$A$  - rainfall,  $B$  - plant loss,  $d$  - w. diffusion  
 $\nu$  - w. flow downhill

One of the most basic phenomenological models is the **extended Klausmeier reaction-advection-diffusion model**.<sup>5</sup>

$$\begin{aligned}\frac{\partial u}{\partial t} &= \underbrace{u^2 w}_{\text{plant growth}} - \underbrace{Bu}_{\text{plant loss}} + \underbrace{\frac{\partial^2 u}{\partial x^2}}_{\text{plant dispersal}}, \\ \frac{\partial w}{\partial t} &= \underbrace{A}_{\text{rainfall}} - \underbrace{w}_{\text{evaporation}} - \underbrace{u^2 w}_{\text{water uptake by plants}} + \underbrace{\nu \frac{\partial w}{\partial x}}_{\text{water flow downhill}} + \underbrace{d \frac{\partial^2 w}{\partial x^2}}_{\text{water diffusion}}.\end{aligned}$$

<sup>5</sup> Klausmeier, C. A.: *Science* 284.5421 (1999).

# Klausmeier model

One of the most basic phenomenological models is the **extended Klausmeier reaction-advection-diffusion model**.

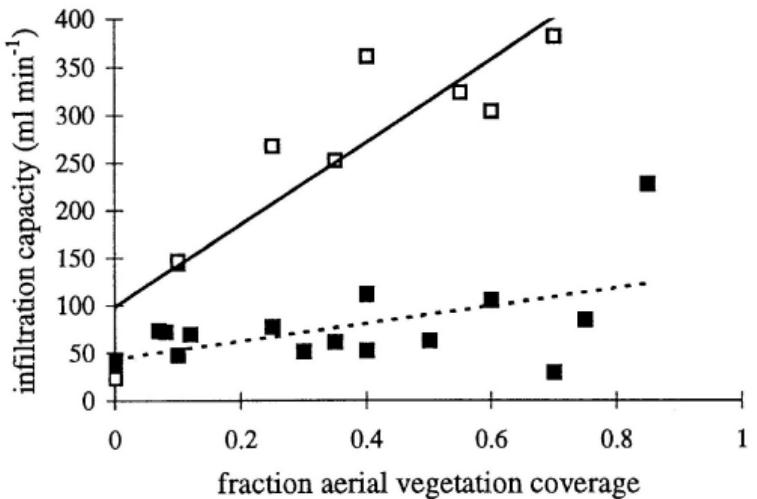
$$\frac{\partial u}{\partial t} = \underbrace{u^2 w}_{\text{plant growth}} - \underbrace{Bu}_{\text{plant loss}} + \underbrace{\frac{\partial^2 u}{\partial x^2}}_{\text{plant dispersal}},$$

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# Water uptake

*A* - rainfall, *B* - plant loss, *d* - w. diffusion

$\nu$  - w. flow downhill



Infiltration capacity increases with plant density<sup>6</sup>

The nonlinearity in the water uptake and plant growth terms arises because plants increase the soil's water infiltration capacity.

⇒ Water uptake = Water density × plant density × infiltration rate.

<sup>6</sup>Rietkerk, M. et al.: *Plant Ecol.* 148.2 (2000)

# Klausmeier Model

The **one-species** extended Klausmeier reaction-advection-diffusion model.

$$\frac{\partial u}{\partial t} = \underbrace{u^2 w}_{\text{plant growth}} - \underbrace{Bu}_{\text{plant loss}} + \underbrace{\frac{\partial^2 u}{\partial x^2}}_{\text{plant dispersal}},$$

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# Multispecies Model

$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
 $D$  - plant diffusion ratio,  $H$  - infiltration effect ratio  
 $\nu$  - w. flow downhill,  $d$  - water diffusion

Multispecies model based on the extended Klausmeier model.

$$\begin{aligned}\frac{\partial u_1}{\partial t} &= \underbrace{wu_1(u_1 + Hu_2)}_{\text{plant growth}} - \underbrace{B_1 u_1}_{\text{plant mortality}} + \underbrace{\frac{\partial^2 u_1}{\partial x^2}}_{\text{plant dispersal}}, \\ \frac{\partial u_2}{\partial t} &= \underbrace{Fwu_2(u_1 + Hu_2)}_{\text{plant growth}} - \underbrace{B_2 u_2}_{\text{plant mortality}} + \underbrace{D \frac{\partial^2 u_2}{\partial x^2}}_{\text{plant dispersal}}, \\ \frac{\partial w}{\partial t} &= \underbrace{A}_{\text{rainfall}} - \underbrace{w}_{\text{evaporation}} - \underbrace{w(u_1 + u_2)(u_1 + Hu_2)}_{\text{water uptake by plants}} + \underbrace{\nu \frac{\partial w}{\partial x}}_{\text{water flow downhill}} + \underbrace{d \frac{\partial^2 w}{\partial x^2}}_{\text{water diffusion}}.\end{aligned}$$

E.g.  $u_1$  is a grass species;  $u_2$  a tree species.  $\Rightarrow B_2 < B_1$ ,  $F < 1$ ,  $H < 1$ ,  $D < 1$ .

# Multispecies Model

$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
 $D$  - plant diffusion ratio,  $H$  - infiltration effect ratio

$k_i$  - carrying capacities,  $\nu$  - w. flow downhill,  $d$  - water diffusion

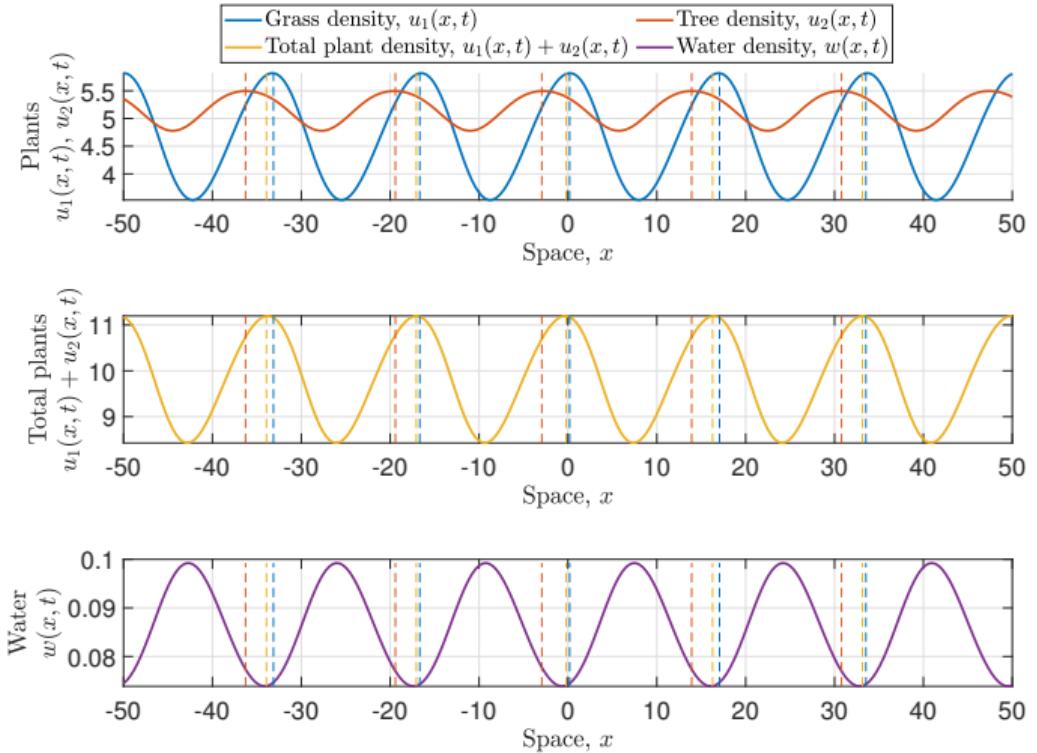
Intraspecific competition may be considered.

$$\begin{aligned}\frac{\partial u_1}{\partial t} &= \underbrace{wu_1(u_1 + Hu_2)}_{\text{plant growth}} \left(1 - \frac{u_1}{k_1}\right) - \underbrace{B_1 u_1}_{\text{plant mortality}} + \underbrace{\frac{\partial^2 u_1}{\partial x^2}}_{\text{plant dispersal}}, \\ \frac{\partial u_2}{\partial t} &= \underbrace{Fwu_2(u_1 + Hu_2)}_{\text{plant growth}} \left(1 - \frac{u_2}{k_2}\right) - \underbrace{B_2 u_2}_{\text{plant mortality}} + \underbrace{D \frac{\partial^2 u_2}{\partial x^2}}_{\text{plant dispersal}}, \\ \frac{\partial w}{\partial t} &= \underbrace{A}_{\text{rainfall}} - \underbrace{w}_{\text{evaporation}} - \underbrace{w(u_1 + u_2)(u_1 + Hu_2)}_{\text{water uptake by plants}} + \underbrace{\nu \frac{\partial w}{\partial x}}_{\text{water flow downhill}} + \underbrace{d \frac{\partial^2 w}{\partial x^2}}_{\text{water diffusion}}.\end{aligned}$$

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# Simulations

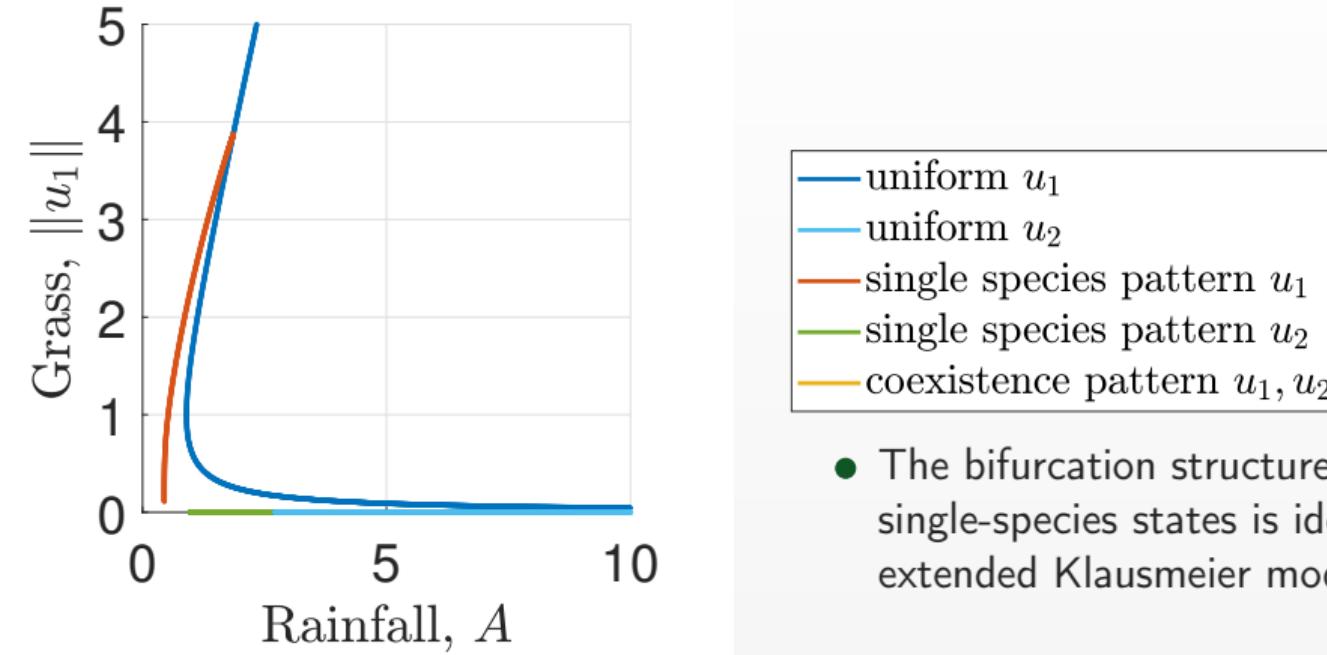
$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
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- Coexistence in the model occurs as a stable **savanna state**.

# Bifurcation diagram

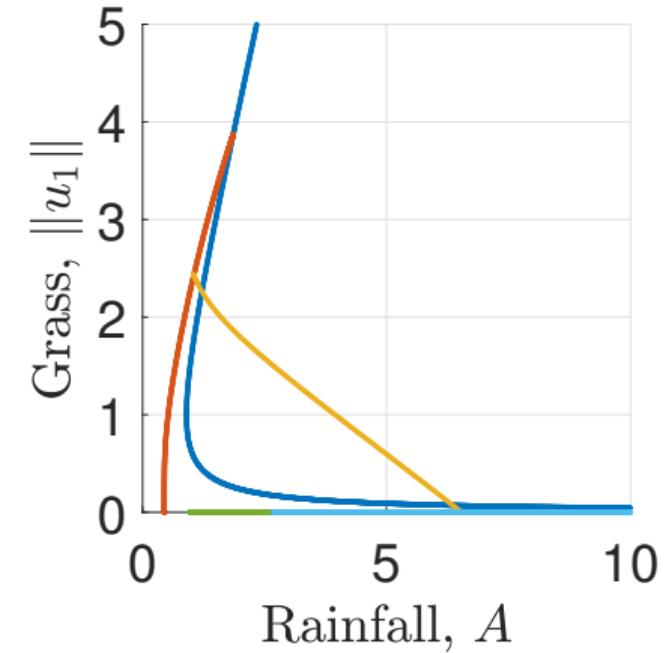
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Bifurcation diagram: single-species states only

# Bifurcation diagram

$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
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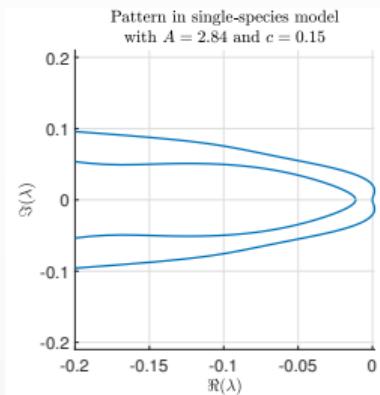
Bifurcation diagram: complete

- uniform  $u_1$
- uniform  $u_2$
- single species pattern  $u_1$
- single species pattern  $u_2$
- coexistence pattern  $u_1, u_2$

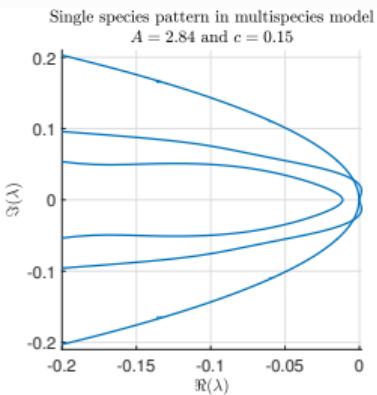
- The bifurcation structure of single-species states is identical with extended Klausmeier model.
- **Coexistence pattern** solution branch connects single-species pattern solution branches.

# Pattern onset

$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
 $D$  - plant diffusion ratio,  $H$  - infiltration effect ratio  
 $k_i$  - carrying capacities,  $\nu$  - w. flow downhill,  $d$  - water diffusion



Essential spectrum in single-species model



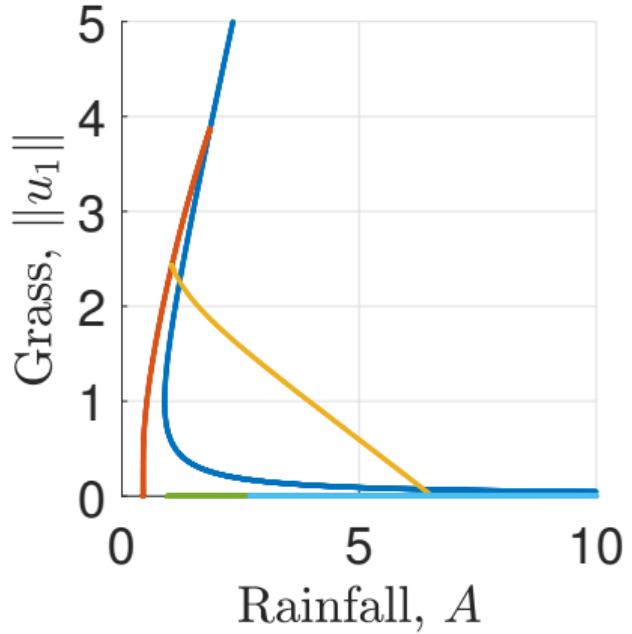
Essential spectrum in multispecies model

- The key to understand **coexistence pattern onset** is knowledge of **single-species pattern's stability**.
- Tool: **essential spectra** of periodic travelling waves, calculated using the numerical continuation method by Rademacher et al.<sup>7</sup>
- **Pattern onset occurs as the single-species pattern loses/gains stability to the introduction of a competitor.**

<sup>7</sup> Rademacher, J. D., Sandstede, B. and Scheel, A.: *Physica D* 229.2 (2007)

## Pattern existence

$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
 $D$  - plant diffusion ratio,  $H$  - infiltration effect ratio  
 $k_i$  - carrying capacities,  $\nu$  - w. flow downhill,  $d$  - water diffusion



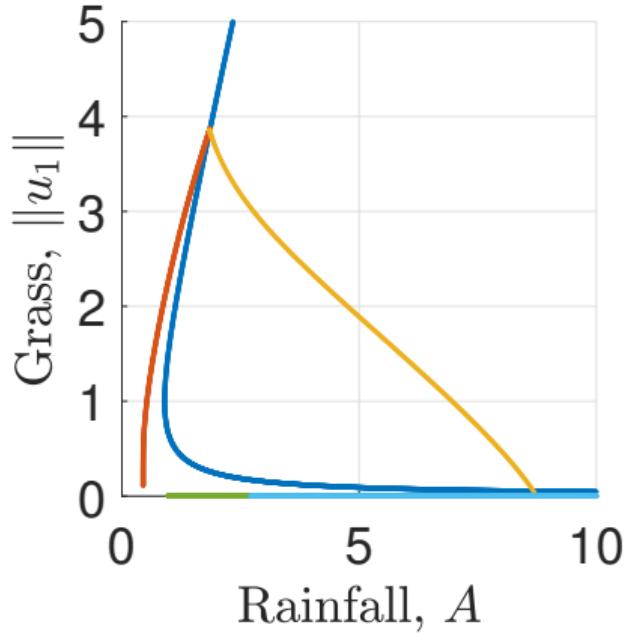
$$B_2 - FB_1 < 0, F < 1, D < 1$$

- uniform  $u_1$
- uniform  $u_2$
- single species pattern  $u_1$
- single species pattern  $u_2$
- coexistence pattern  $u_1, u_2$

- Key quantity: **Local average fitness difference  $B_2 - FB_1$**  determines stability of single-species states in spatially uniform setting.
- Condition for pattern existence: **Balance between local competitive and colonisation abilities.**

## Pattern existence

$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
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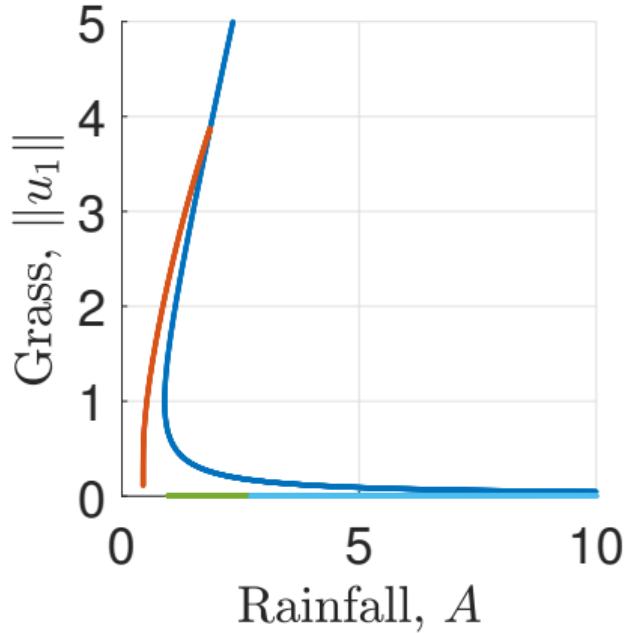
$$B_2 - FB_1 \approx 0, F < 1, D < 1$$

- uniform  $u_1$
- uniform  $u_2$
- single species pattern  $u_1$
- single species pattern  $u_2$
- coexistence pattern  $u_1, u_2$

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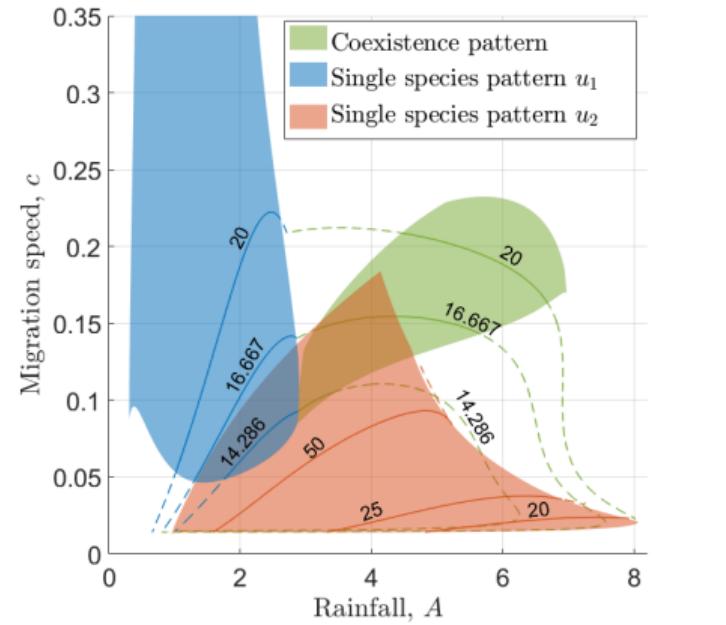
$$B_2 - FB_1 > 0, F < 1, D < 1$$

- uniform  $u_1$
- uniform  $u_2$
- single species pattern  $u_1$
- single species pattern  $u_2$
- coexistence pattern  $u_1, u_2$

- Key quantity: Local average fitness difference  $B_2 - FB_1$  determines stability of single-species states in spatially uniform setting.
- Condition for pattern existence: Balance between local competitive and colonisation abilities.

# Pattern stability

$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
 $D$  - plant diffusion ratio,  $H$  - infiltration effect ratio  
 $k_i$  - carrying capacities,  $\nu$  - w. flow downhill,  $d$  - water diffusion



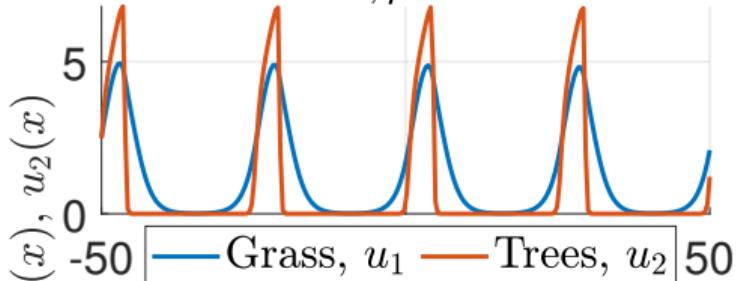
- Pattern dynamics (wavelength, migration speed) are dominated by properties of coloniser species.
- Busse balloons of coexistence patterns and single-species tree patterns overlap  $\Rightarrow$  potentially significant ecologically (ecosystem engineering).
- For decreasing rainfall, coexistence savanna state loses stability to single-species grass pattern.

Busse balloons of all pattern types in the system

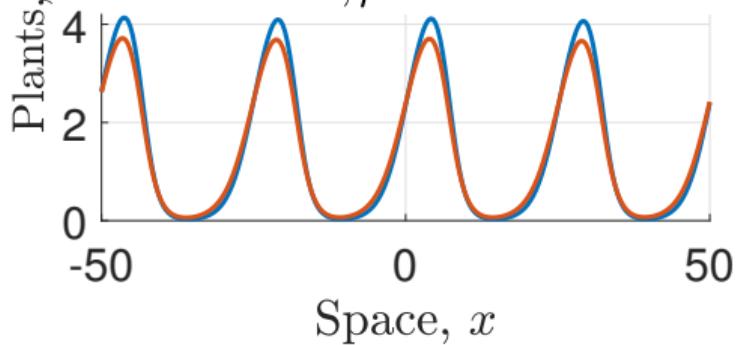
# Effects of intraspecific competition

$A$  - rainfall,  $B_i$  - plant loss,  $F$  - plant growth ratio,  
 $D$  - plant diffusion ratio,  $H$  - infiltration effect ratio  
 $k_i$  - carrying capacities,  $\nu$  - w. flow downhill,  $d$  - water diffusion

$$D = 0.001, \rho = 0.83296$$



$$D = 1, \rho = 0.99648$$



- Strong intraspecific competition of the coloniser species stabilises coexistence in vegetation patterns.
- The model captures the spatial species distribution of grasses and trees in a pattern.
- The faster the coloniser's dispersal, the more pronounced is its presence at the top edge of each stripe.

# Conclusions

- The basic phenomenological reaction-advection-diffusion system captures species coexistence as
  - (i) a stable patterned solution representing a savanna state.
  - (ii) a stable vegetation pattern state if intraspecific competition among the superior coloniser is sufficiently strong.
  - (iii) a metastable state if the average fitness difference between species is small<sup>8</sup>.
- Coexistence is enabled by spatial heterogeneities in the resource, caused by the plants' self-organisation into patterns.
- Stability analyses of spatially uniform solutions and periodic travelling waves (via a calculation of essential spectra) provide insights into existence and stability of coexistence states.

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<sup>8</sup>Eigentler, L. and Sherratt, J. A.: *Bull. Math. Biol.* 81.7 (2019).

## Future Work

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- How does nonlocal seed dispersal affect species coexistence?
- Do results extend to an arbitrary number of species?
- How do fluctuations in environmental conditions (in particular precipitation) affect coexistence?
- In particular, what are the effects of seasonal<sup>9</sup>, intermittent<sup>10</sup> and probabilistic rainfall regimes on both single-species and multispecies states?

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<sup>9</sup>EL and Sherratt, J. A.: *An integrodifference model for vegetation patterns in semi-arid environments with seasonality* (submitted).

<sup>10</sup>EL and Sherratt, J. A.: *Effects of precipitation intermittency on vegetation patterns in semi-arid landscapes* (submitted).

## References

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I am currently looking for a postdoc position. Please speak to me if you are aware of any opportunities.

-  Eigentler, L.: 'Intraspecific competition can generate species coexistence in a model for dryland vegetation patterns'. *bioRxiv preprint* (2020).
-  Eigentler, L. and Sherratt, J. A.: 'Metastability as a coexistence mechanism in a model for dryland vegetation patterns'. *Bull. Math. Biol.* 81.7 (2019), pp. 2290–2322.
-  Eigentler, L. and Sherratt, J. A.: 'Spatial self-organisation enables species coexistence in a model for savanna ecosystems'. *J. Theor. Biol.* 487 (2020), p. 110122.