

# Motivation

- Biogeochemical models that explicitly consider functional traits and physiology of microorganisms are **complex**
- Mathematical analysis provides a leverage point to **reduce the complexity of models** and fosters understanding of qualitative system behavior
- We analyze the PECCAD model applying methods from the field of **dynamic systems theory** in order to gain a holistic understanding of microbial dynamics and matter cycling in soil

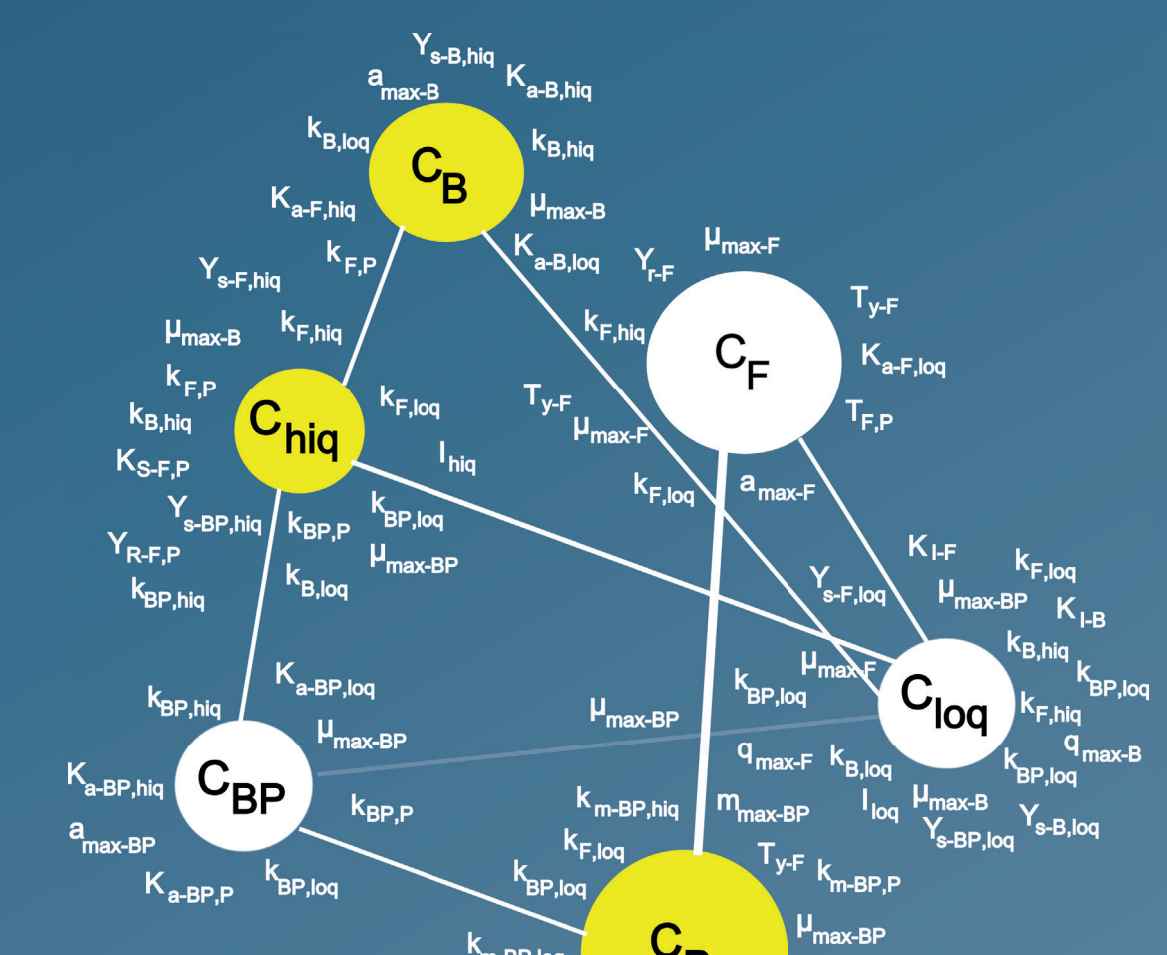
## PECCAD Main Feature

### Direct Pesticide Utilization

$$\mu_{BP,P} = \frac{\mu_{max-BP} k_{BP,P} C_P}{\mu_{max-BP} + k_{BP,P} C_P + k_{BP,hiq} C_{hiq} + k_{BP,loq} C_{loq}}$$

### Cometabolic Degradation

$$q_{F,P} = (T_{y-F} \cdot (\mu_{F,hiq} + \mu_{F,loq}) + k_{F,P}) \cdot \frac{C_P}{K_{s-F,P} + C_P}$$



## Bifurcation Theory

A bifurcation occurs when a small change made to parameter values in the model leads to a qualitative change in dynamic behavior of the system

PECCAD (PEsticide degradation Coupled to CARbon turnover in the Detritosphere (Pagel et al. (2014))) has a 51 dim. parameter space

# Physiological Activity

Active microbial biomass is a driver of biogeochemical cycles, but existing minimal models representing physiological states lack experimental validation.  
**How can we distinguish between models?**

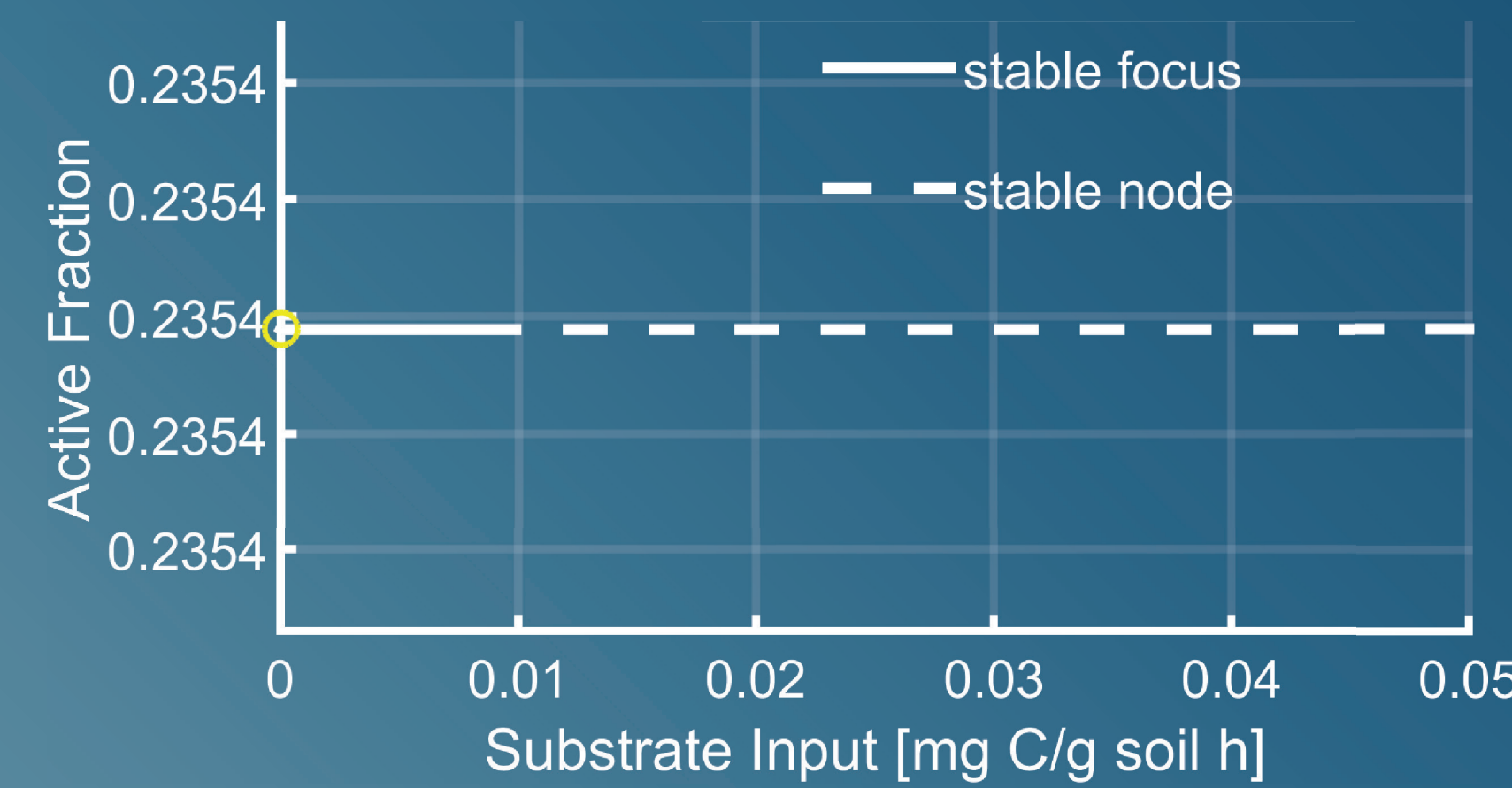
## Wang et al. (2014)

Transition term

$$(1 - \phi) m_R B_a + \phi m_R B_d$$

Substrate saturation

$$\phi = \frac{S}{K_s + S}$$

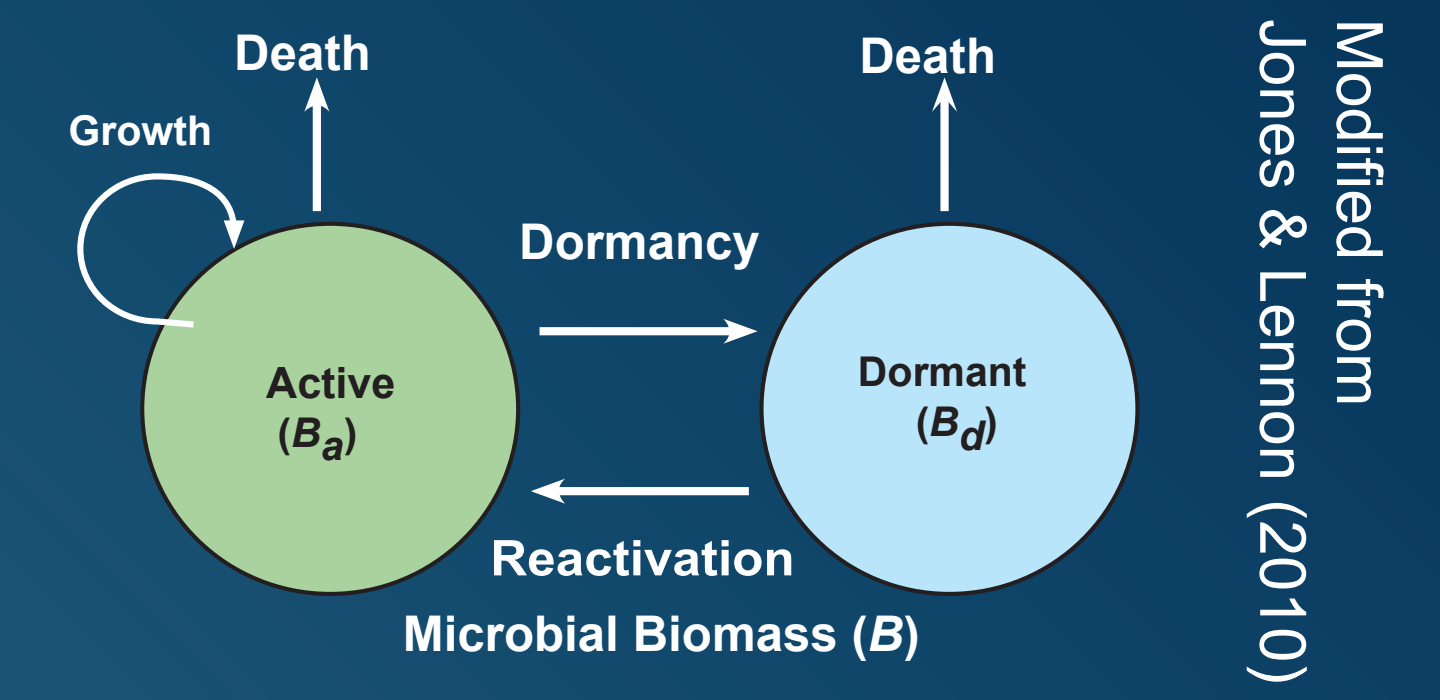
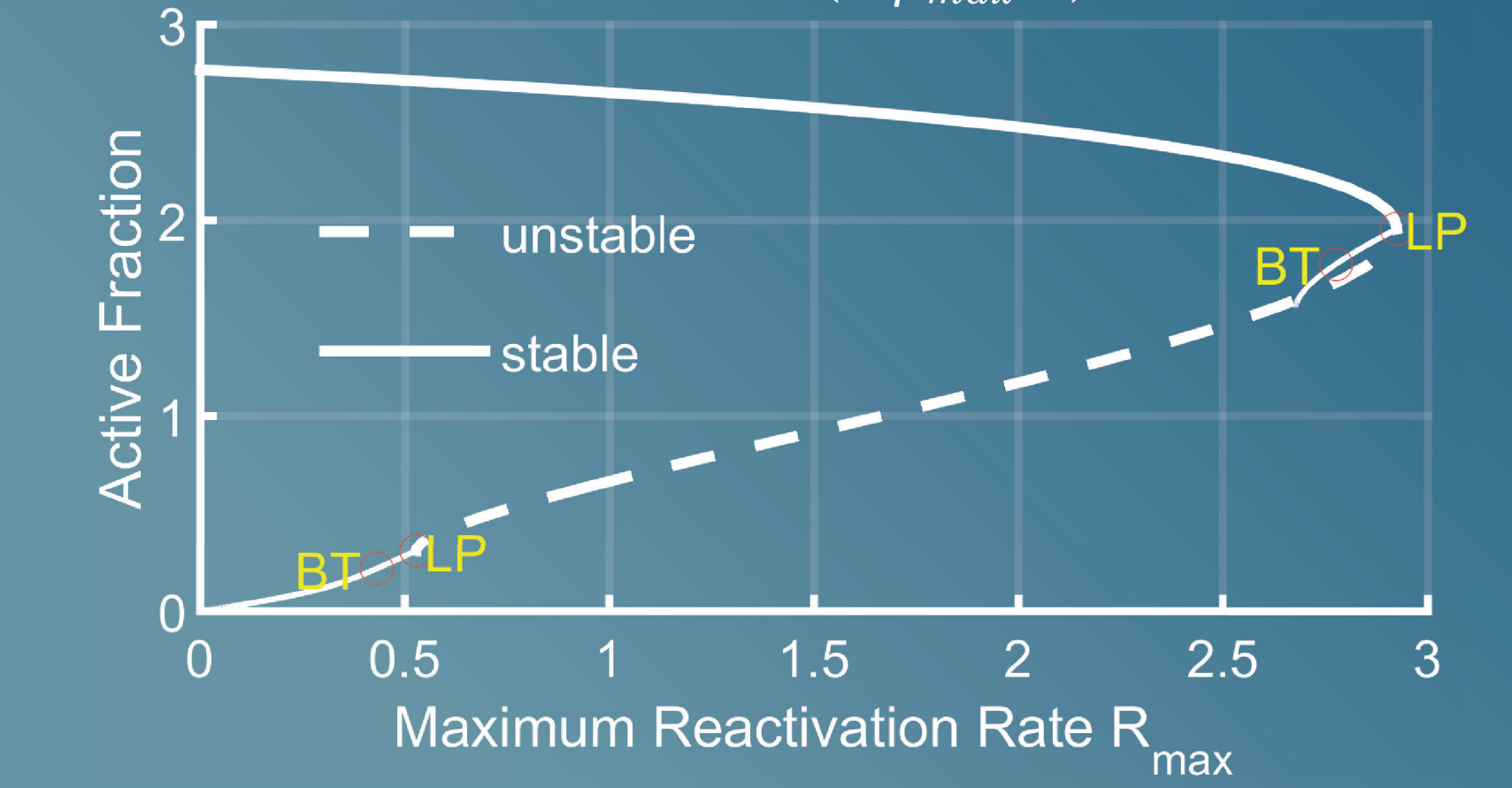


## Jones & Lennon (2010)

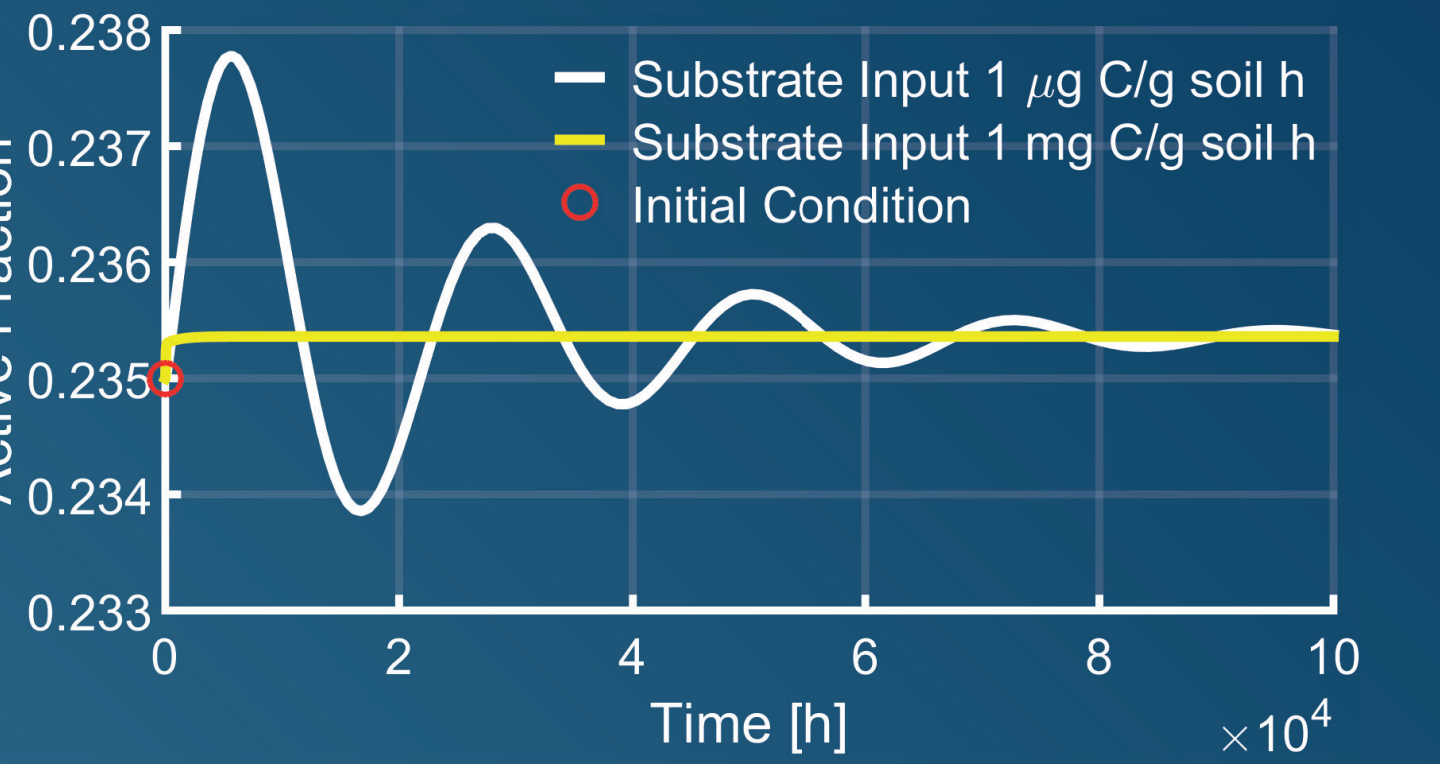
Transition term

$$(1 - R) B_a - R B_d$$

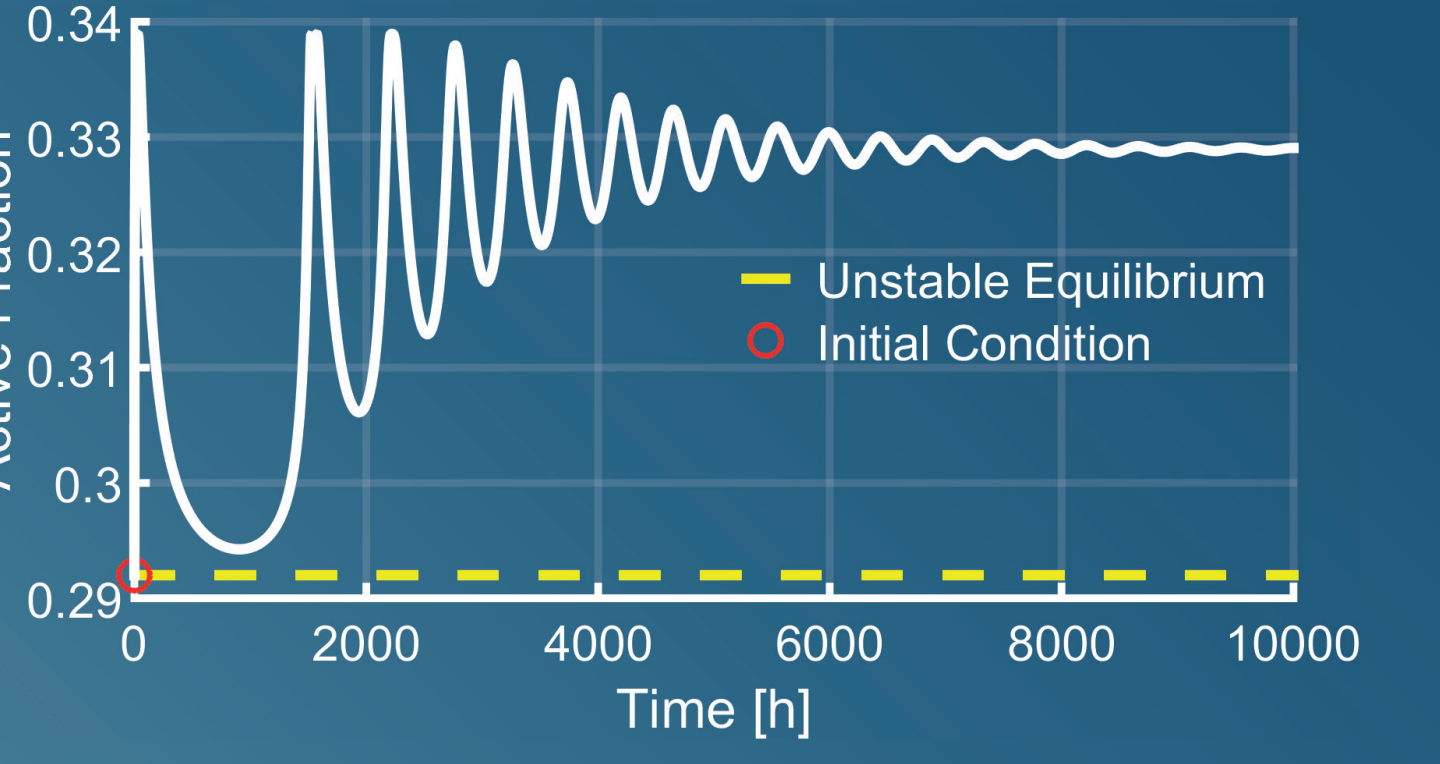
$$R = R_{max} \exp\left(-\left(\frac{\mu_{max} - \mu}{\mu_{max}}\right)^2\right)$$



## System shows simple relaxation oscillations



## System driven away from unstable equilibrium



# Simplifying the Complexity of a Coupled Carbon Turnover and Pesticide Degradation Model

Gianna Marschmann<sup>1</sup>, André H. Erhardt<sup>2</sup>, Holger Pagel<sup>1</sup>, Philipp Kügler<sup>2</sup> and Thilo Streck<sup>1</sup>  
<sup>1</sup>Institute of Soil Science and Land Evaluation  
<sup>2</sup>Institute of Applied Mathematics and Statistics



## Results

Exponential dependence of microbial reactivation rate leads to complex model dynamics

Multiple time scales in the PECCAD model make a bifurcation analysis possible

# Time Scales and Dimensional Analysis

The complexity of coupled soil models has to be reduced in order to conduct a stability analysis. This is achieved by identifying **multiple time scales**.

## PECCAD has Three Distinct Time Scales

Based on dimensional analysis, it is possible to propose a **hierarchy of variables** according to the time scales on which they evolve. Such a **fast-slow system** is amenable to bifurcation analysis: in the singular limit, two 3 dimensional systems can be analyzed separately.

### Superfast Pesticide

$$\epsilon \frac{dc_P}{d\tau} = c_P \left[ -\frac{\tilde{\mu}_{BP,P}(k_c c_i)}{Y_{s-BP,P}} - \tilde{m}_{BP,P}(k_c c_i) \right] - c_P \tilde{q}_{F,P}(k_c c_i) + \tilde{I}_P$$

### Fast High Quality Carbon

$$\sqrt{\epsilon} \frac{dc_{hiq}}{d\tau} = f_2(k_c c_{hiq}, k_c c_{loq}, k_c c_P, k_c c_B, k_c c_{BP}, k_c c_F)$$

### Fast Bacterial Biomass

$$\sqrt{\epsilon} \frac{dc_B}{d\tau} = f_3(k_c c_{hiq}, k_c c_{loq}, k_c c_P, k_c c_B, k_c c_{BP}, k_c c_F)$$

$$0 < \epsilon = 1/(k_t \tau_x) \ll 1$$

$$\frac{dc_{loq}}{d\tau} = g_1(k_c c_{hiq}, k_c c_{loq}, k_c c_P, k_c c_B, k_c c_{BP}, k_c c_F)$$

$$\frac{dc_F}{d\tau} = g_2(k_c c_{hiq}, k_c c_{loq}, k_c c_P, k_c c_B, k_c c_{BP}, k_c c_F)$$

$$\frac{dc_{BP}}{d\tau} = g_3(k_c c_{hiq}, k_c c_{loq}, k_c c_P, k_c c_B, k_c c_{BP}, k_c c_F)$$

slow

### References

- Pagel, H., et al. Biogeochemistry 117.1 (2014): 185-204
- Wang et al., PloS one 9.2 (2014): e89252
- Jones, Stuart E., and Jay T. Lennon, Proceedings of the National Academy of Sciences 107.13 (2010): 5881-5886
- Govaerts, W. et al., „MATCONT and CL MATCONT: Continuation toolboxes in Matlab.“, Tech. Rep (2011)
- Desroches, M., et al. SIAM Review 54.2 (2012). 211-288

Contact: gianna.marschmann@uni-hohenheim.de

## Kinetic Functions give the Time Scale of a Variable

As part of a nondimensionalization procedure, three scaling constants are introduced. The **scale** of a variable provides an estimate of its maximum order of magnitude.

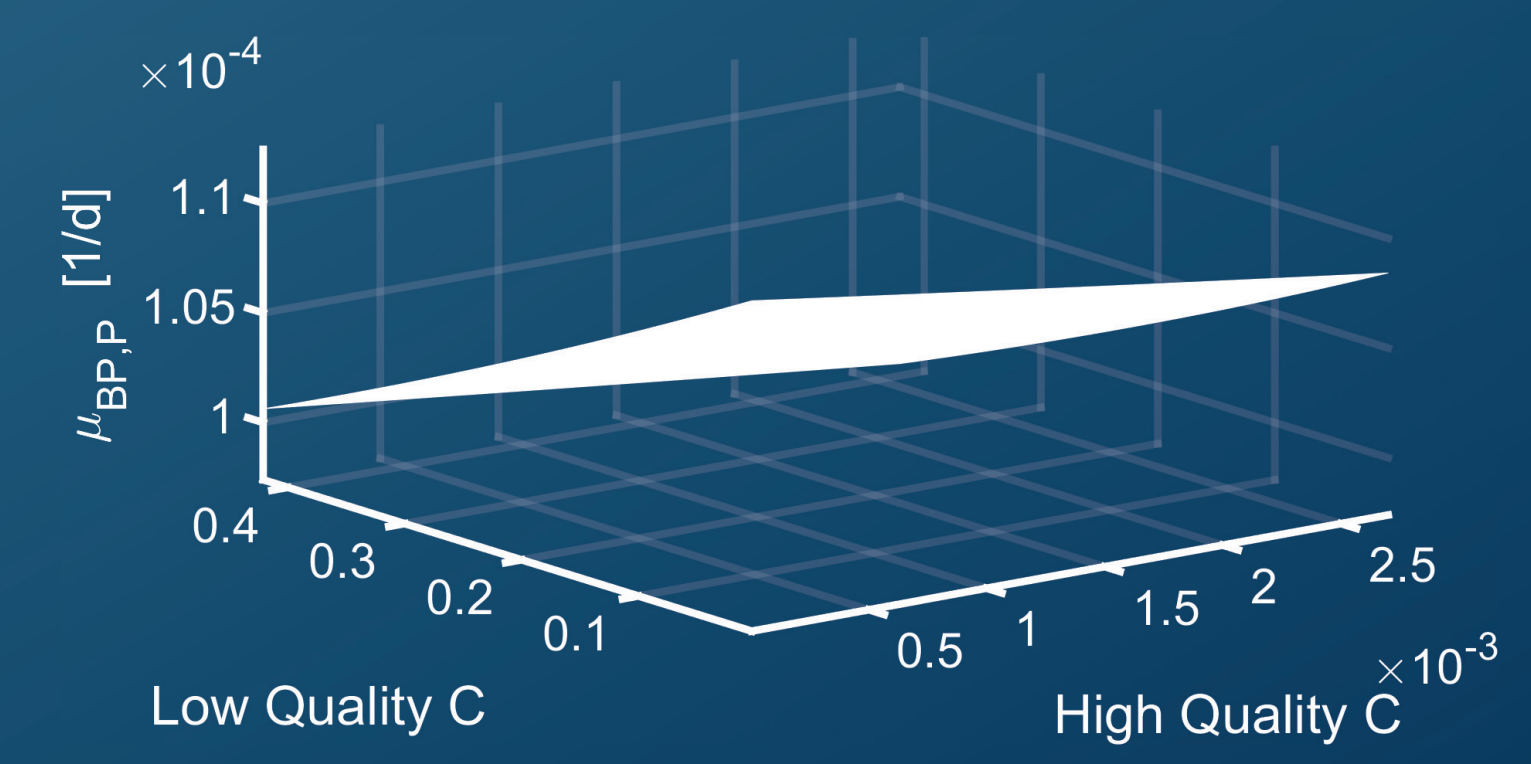
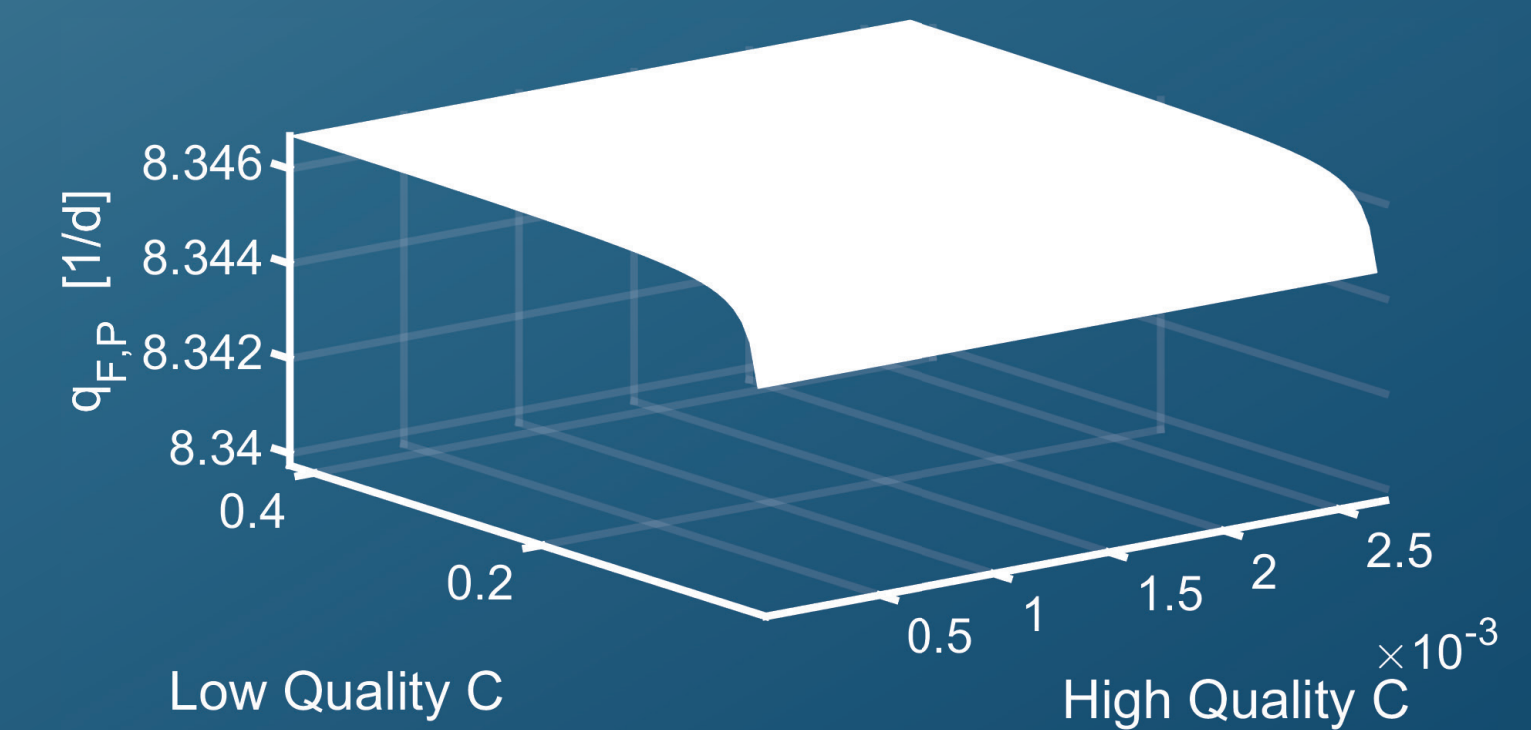
Carbon concentrations:  $C_i = k_c \cdot c_i, \quad i = \{hiq, loq, P, B, BP, F\}$

Time:  $t = k_t \cdot \tau$

Kinetic functions:  $\tau_x = \max_{0 \leq c_i \leq 1} \tau_x(k_c c_i)$

## Example: Pesticide Concentration

$$\frac{dc_P}{d\tau} = c_P \left[ -\frac{\tilde{\mu}_{BP,P}(k_c c_i)}{Y_{s-BP,P}} - \tilde{m}_{BP,P}(k_c c_i) \right] - c_P \tilde{q}_{F,P}(k_c c_i) + \tilde{I}_P$$



Examples of kinetic functions that define characteristic time scales for the pesticide variable. Cometabolic degradation  $q_{F,P}$  is the dominant process.