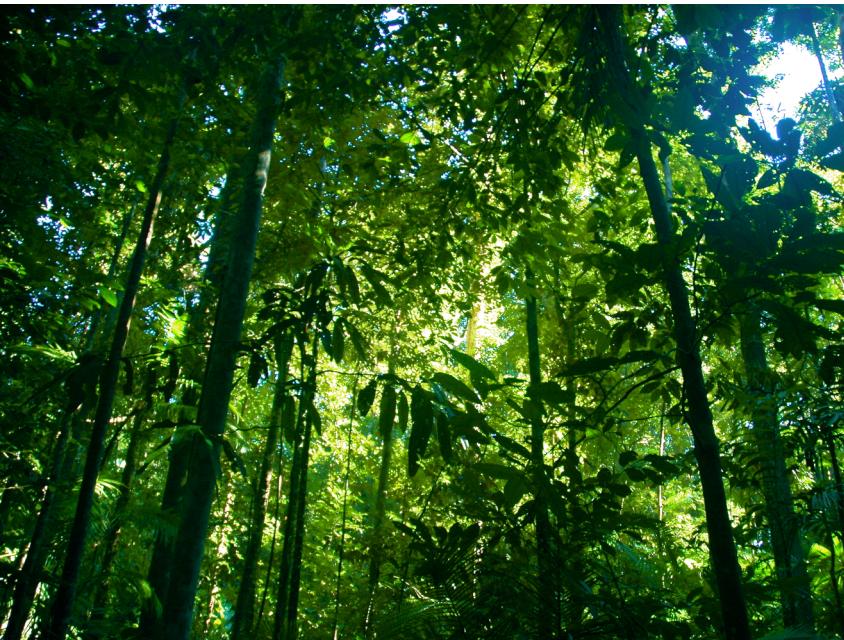


Stability Analysis of Rainforest

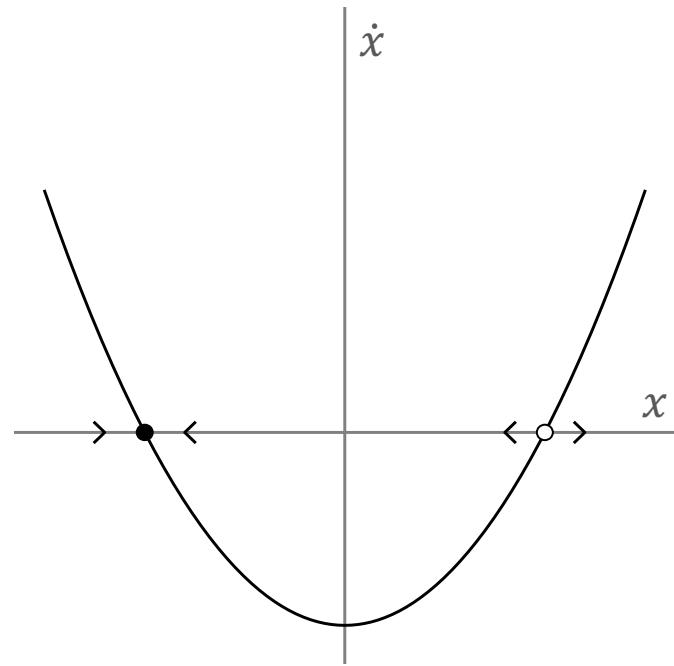


Bifurcation Theory

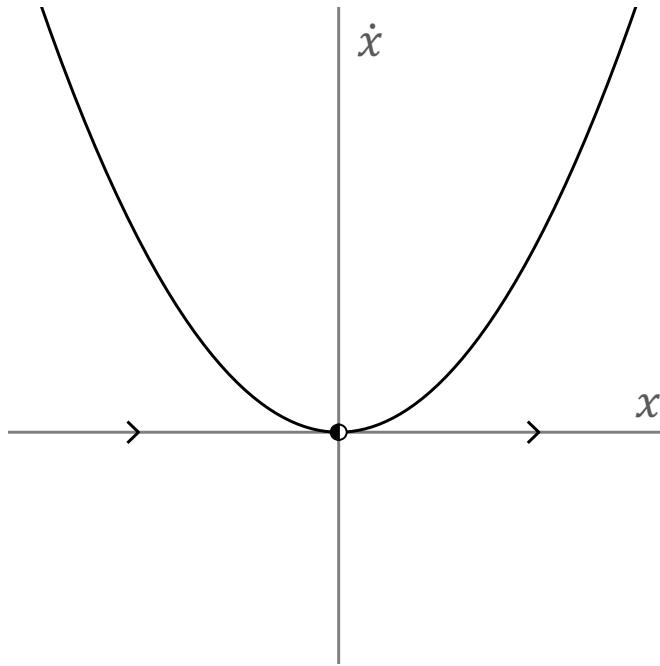
A short reminder

Example:

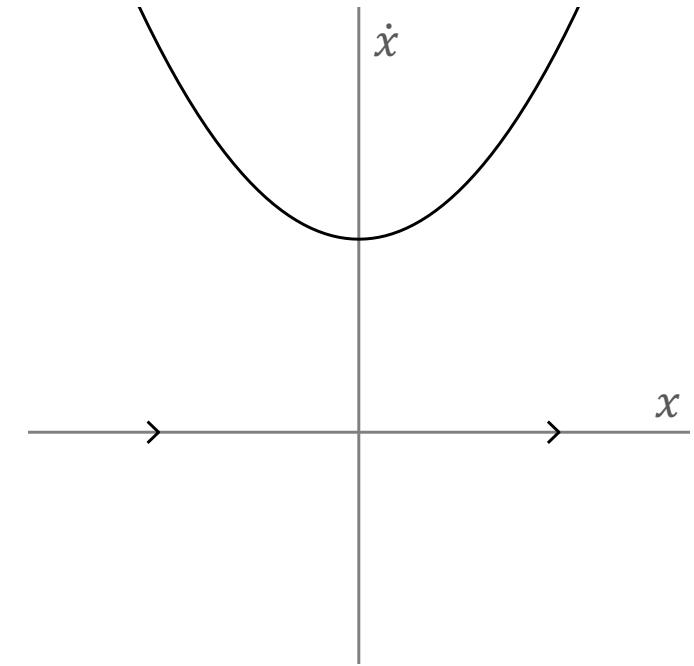
$$\dot{x} = r + x^2$$



$$r < 0$$



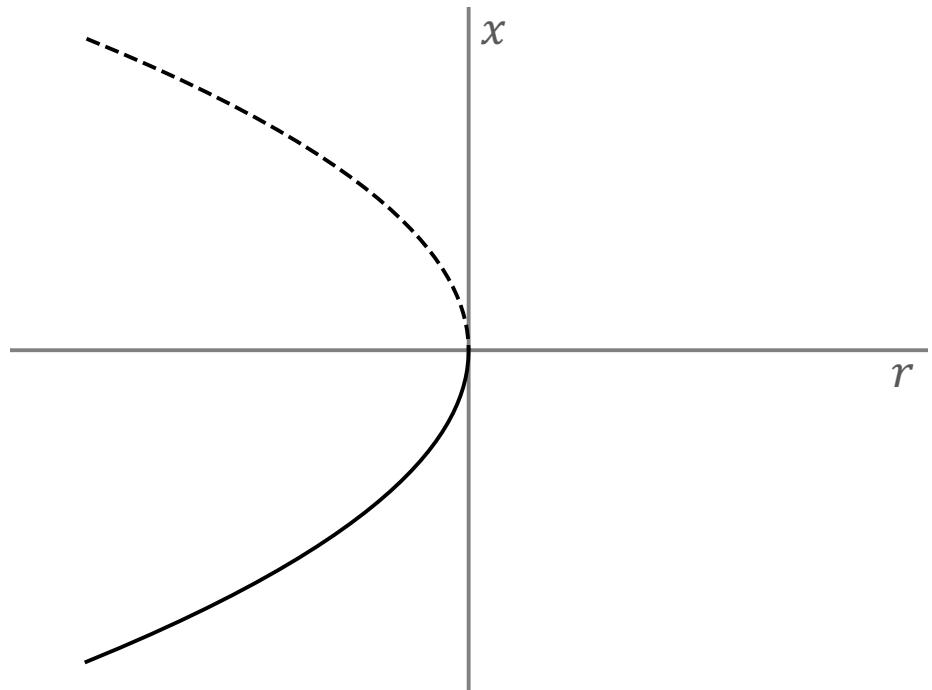
$$r = 0$$



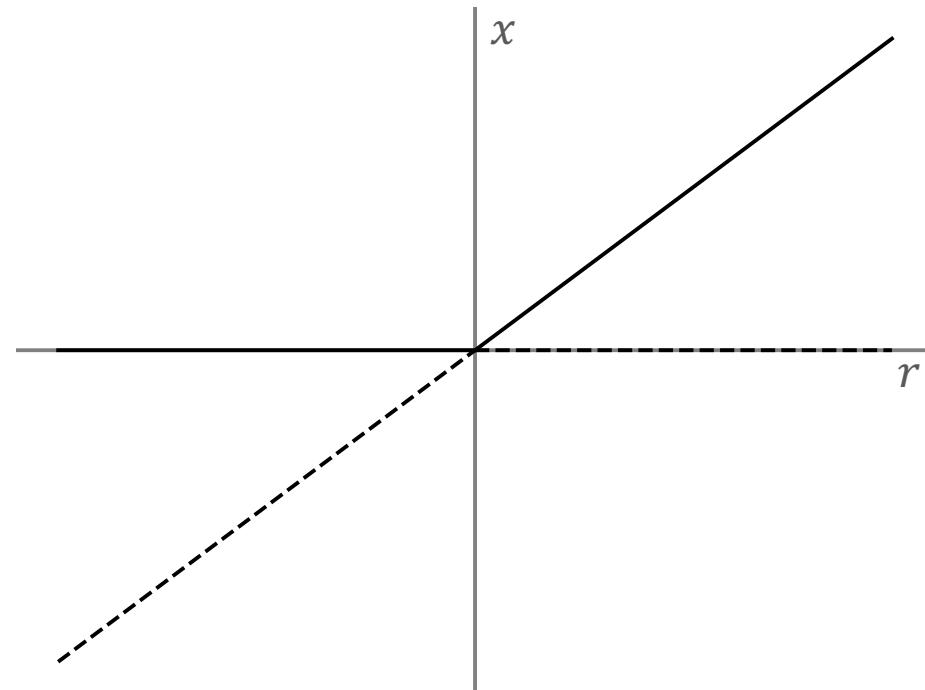
$$r > 0$$

Bifurcation Diagrams

Critical slowing down, Transcritical Bifurcation



$$\dot{x} = r + x^2$$



$$\dot{x} = rx - x^2$$

Tree-Cover Model

Dynamics of Tree-Cover (T in %) in dependence
of Precipitation (P in $\text{mm} \cdot \text{yr}^{-1}$)

- Logistic growth
- K ... maximum Tree-Cover

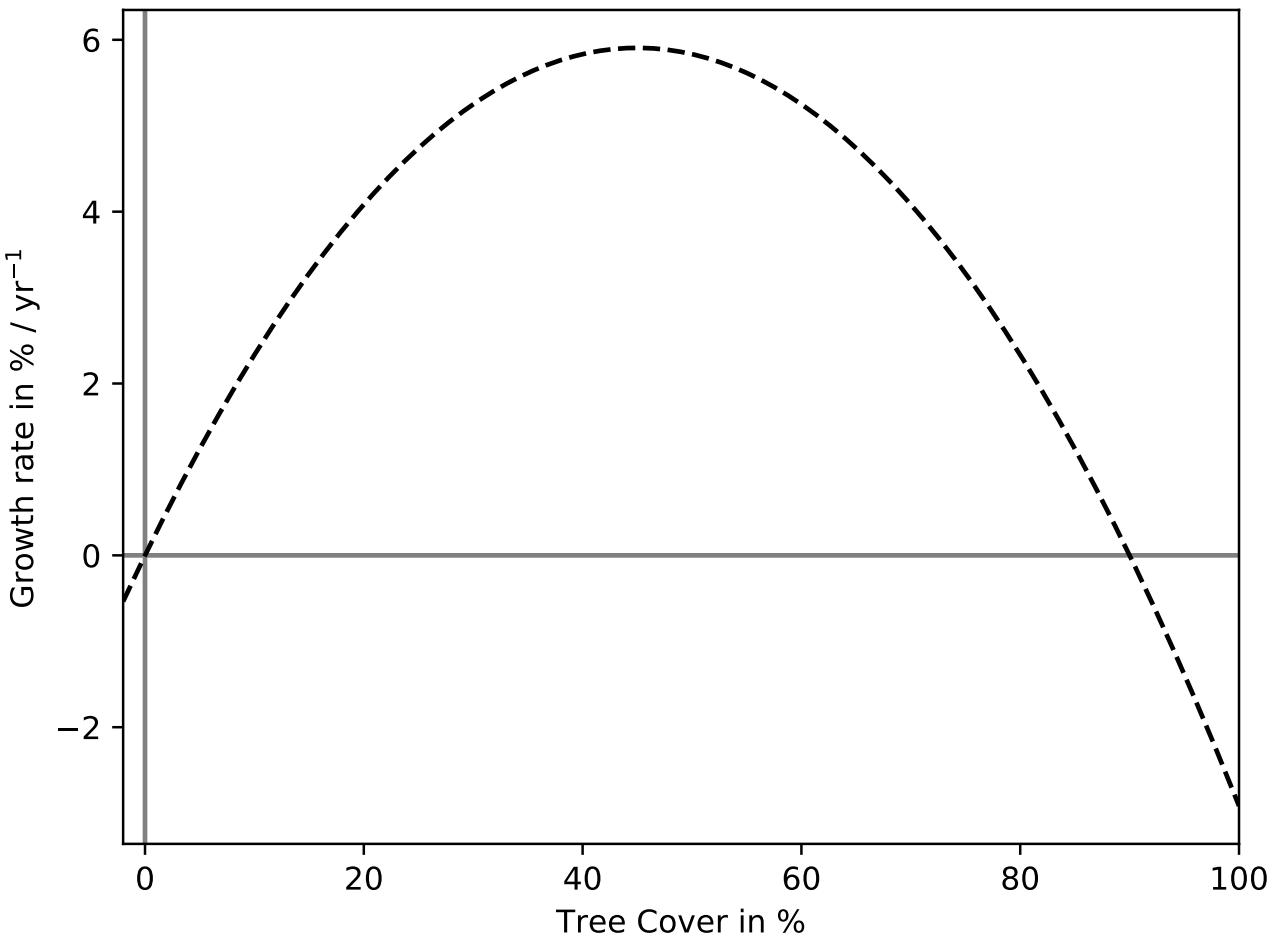
$$\frac{dT}{dt} = T \left(1 - \frac{T}{k}\right)$$

Tree-Cover Model

Expansion rate

- $r(P)$... expansion rate
- $r(P) = r_m \frac{P}{P+h_P}$
- Saturating function / Monod Equation

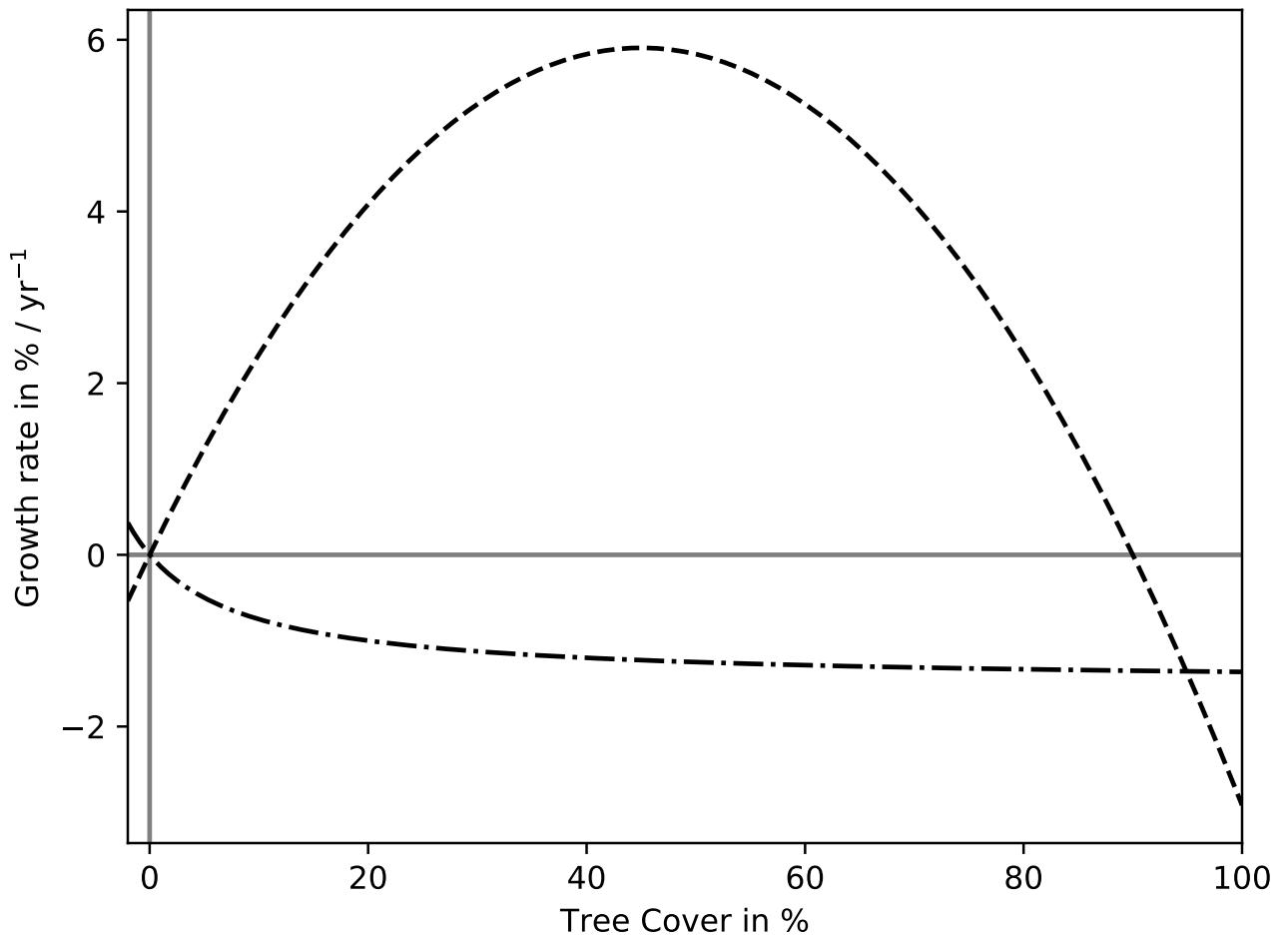
$$\frac{dT}{dt} = r(P)T \left(1 - \frac{T}{k}\right)$$



Tree-Cover Model

Allee effect

- m_A ... maximum loss rate due to Allee-Effect
- h_A ... Tree-cover below which there is an Allee effect
- Saturating function / Monod Equation
- Allee effect: Lower growth rate at low densities.
- Reason: lack of protective covering from „nurse plants“

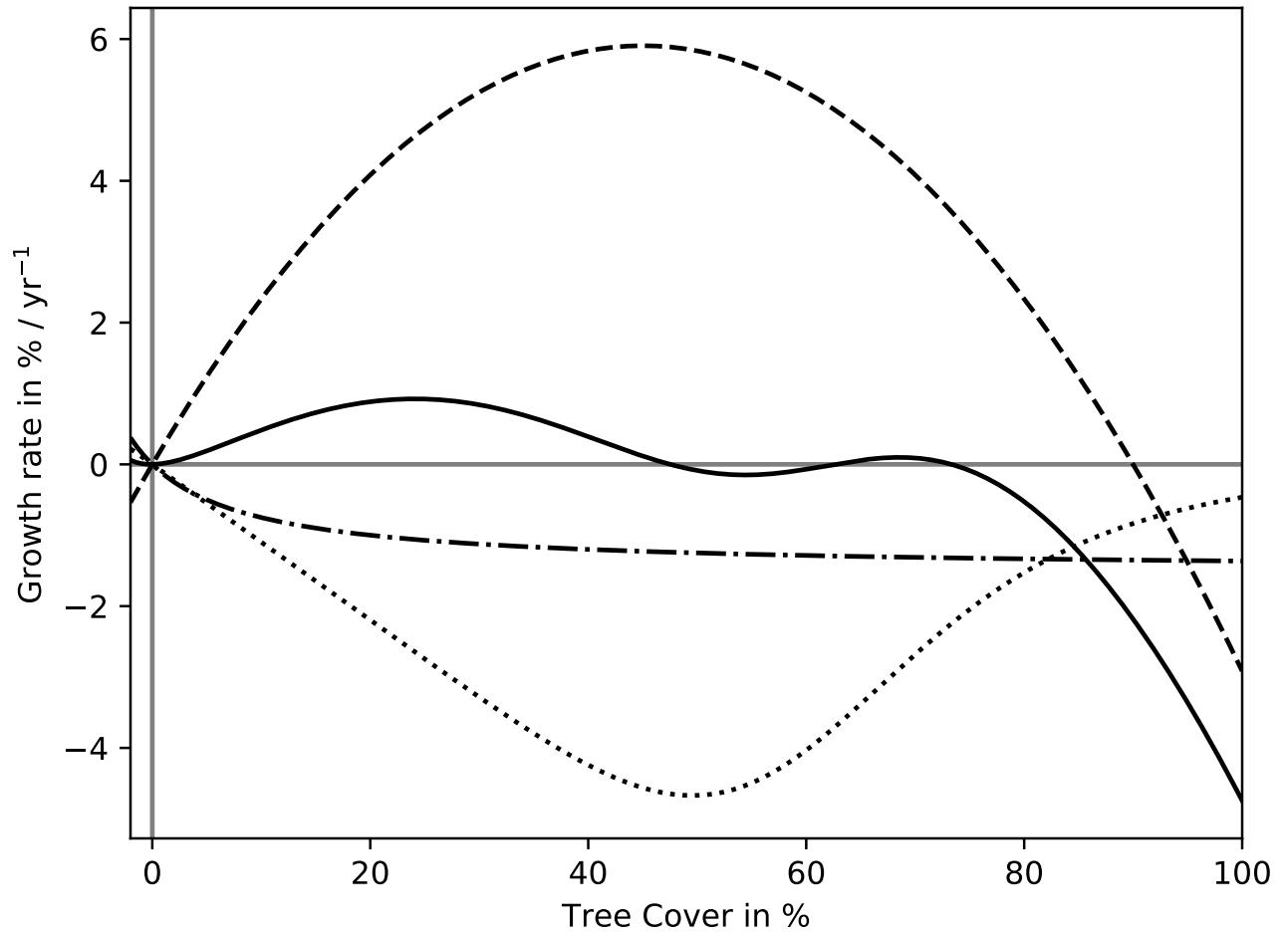


$$\frac{dT}{dt} = r(P)T \left(1 - \frac{T}{k}\right) - m_A T \frac{h_A}{T + h_A}$$

Tree-Cover Model

Allee effect

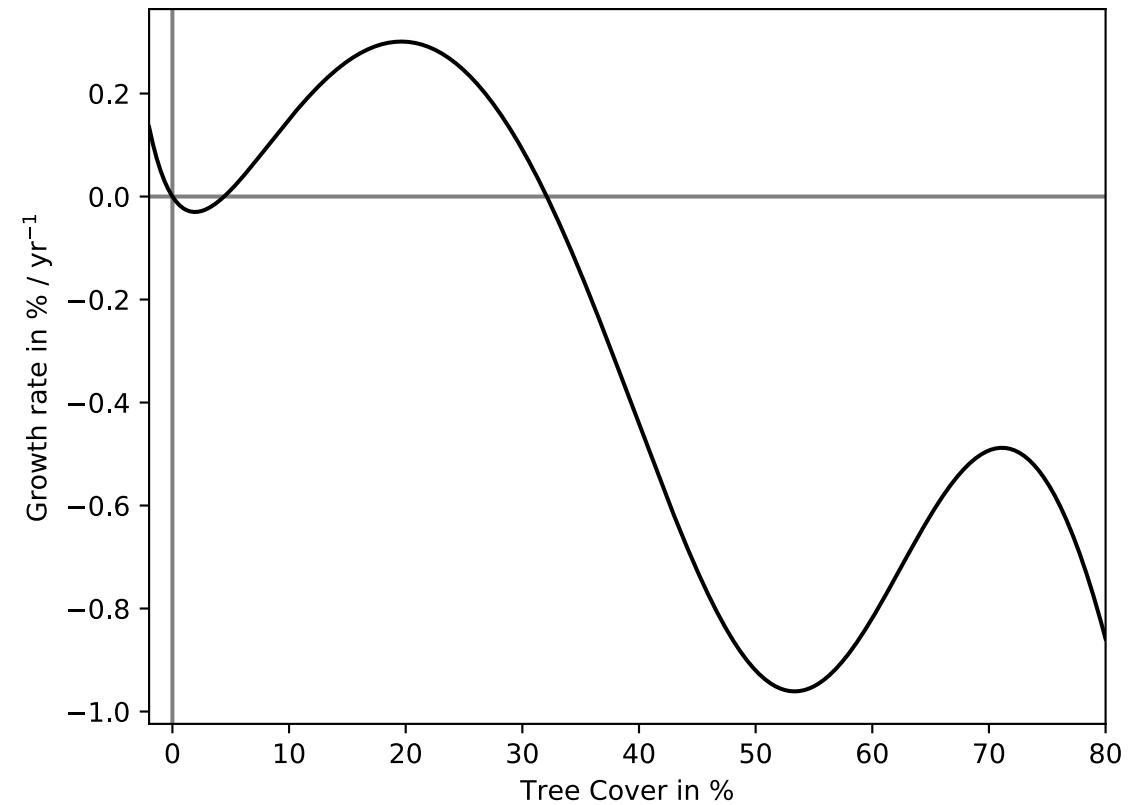
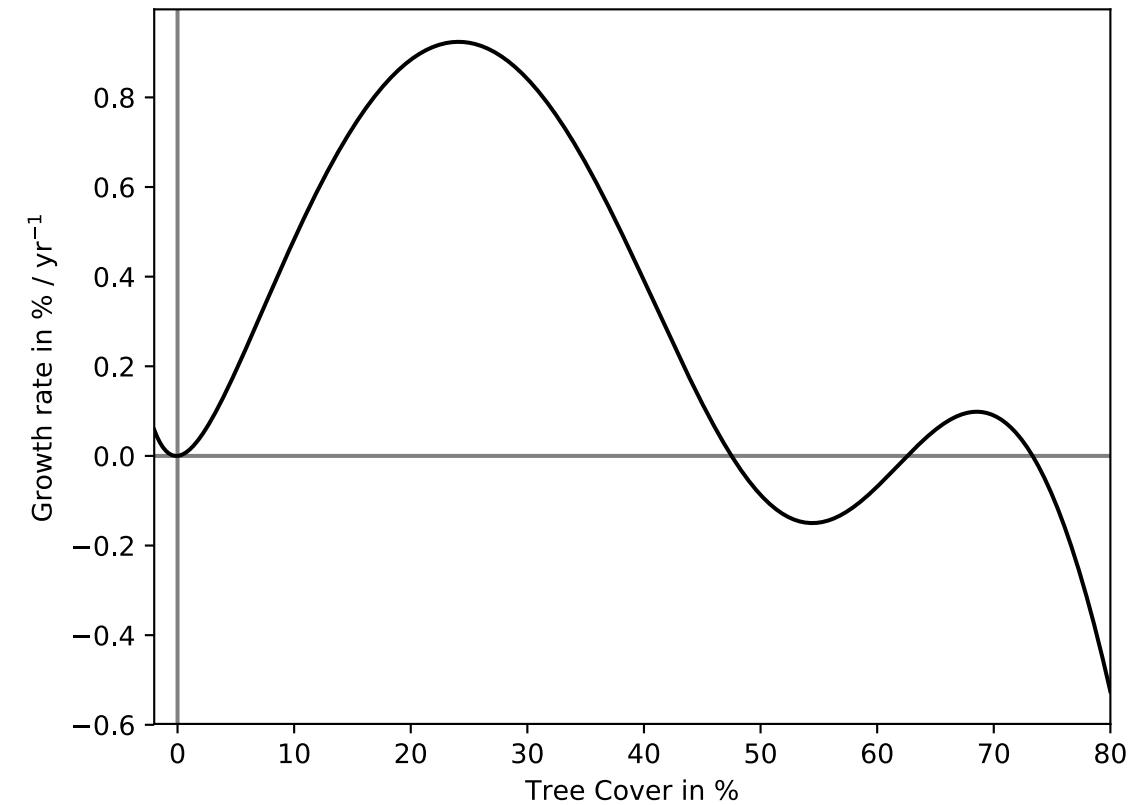
- m_f ... maximum loss rate due to fire
- h_A ... Tree-cover below which fire extinction rises
- sigmoidal Hill function
- Mortality due to fire declines at high Tree-Covers
- Reason: High moisture, less grass



$$\frac{dT}{dt} = r(P)T \left(1 - \frac{T}{k}\right) - m_A T \frac{h_A}{T + h_A} - m_f T \frac{h_f^p}{T^p + h_f^p}$$

Tree-Cover Model

Stable solutions



Tree-Cover Model

Solving the differential equation

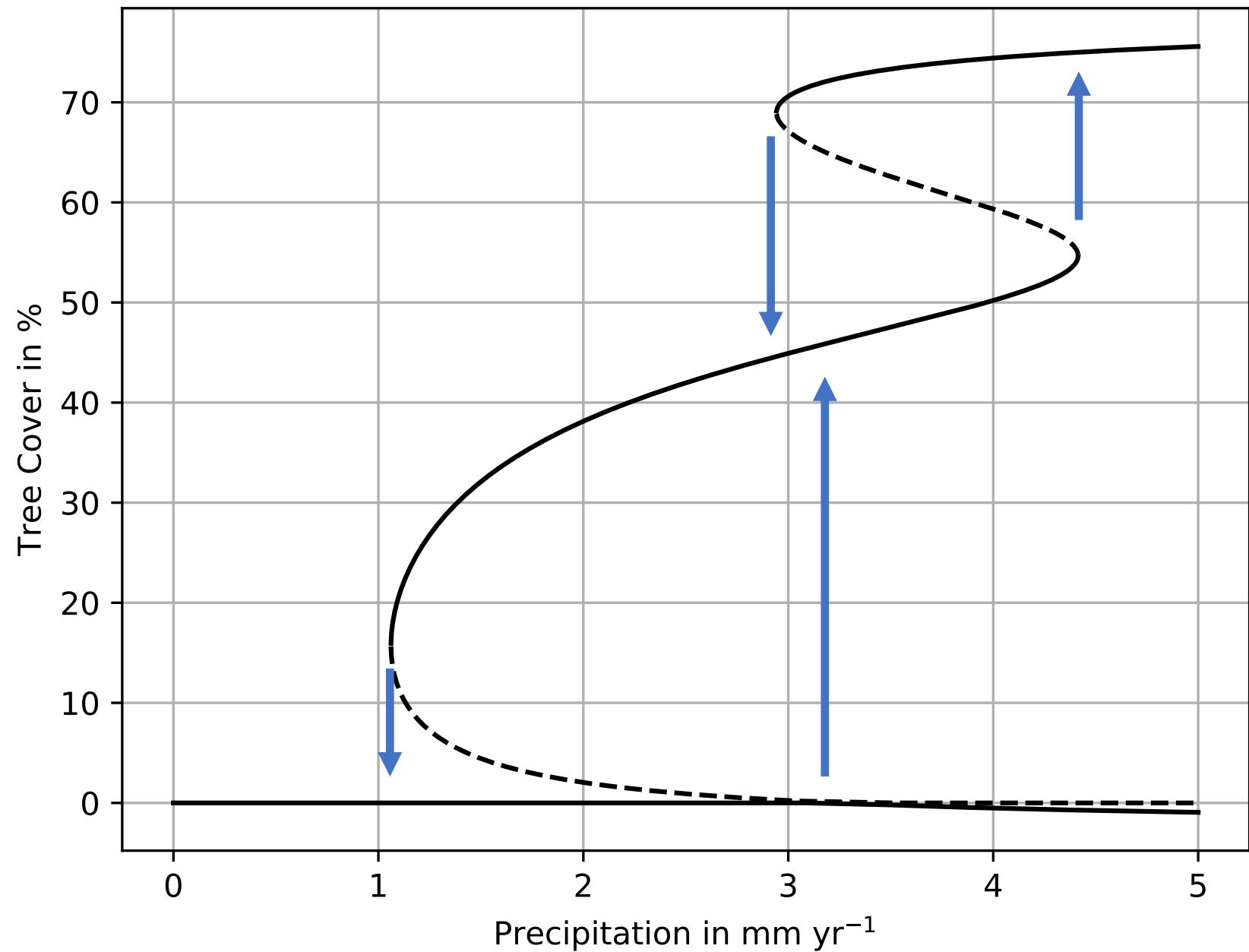
$$\frac{dT}{dt} = r(P)T \left(1 - \frac{T}{k}\right) - m_A T \frac{h_A}{T + h_A} - m_f T \frac{h_f^p}{T^p + h_f^p} \stackrel{!}{=} 0$$

1. Look roughly for a sign change
2. Use the Newton-Algorithm look for the zero points
3. Let the Computer do its magic

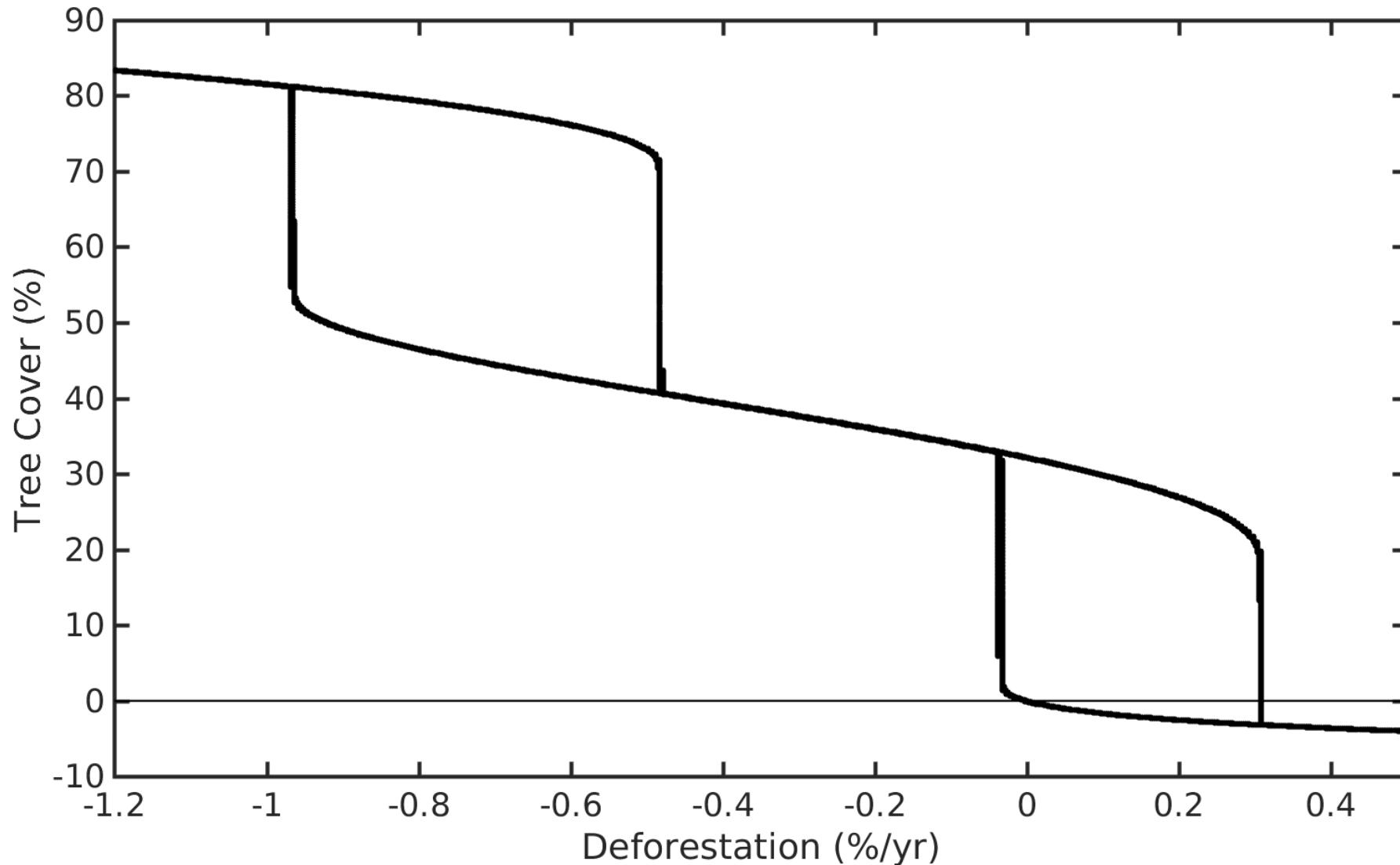
```
tree-cover-model — Python tree-cover-model.py — 67x18
4.99929999299993
4.999349993499935
4.9993999939999405
4.999449994499945
4.9994999499995
4.999549995499955
4.999599995999961
4.999649996499965
4.99969999699997
4.9997499974999755
4.99979999799998
4.999849998499985
4.99989999899999
4.999949999499996
5.0
[Rubens-MacBook-Pro:tree-cover-model rubennitsche$ python3 tree-cover-model.py]
```

Tree-Cover Model

Bifurcation diagram



Variation of Deforestation



Recovery rate from perturbations

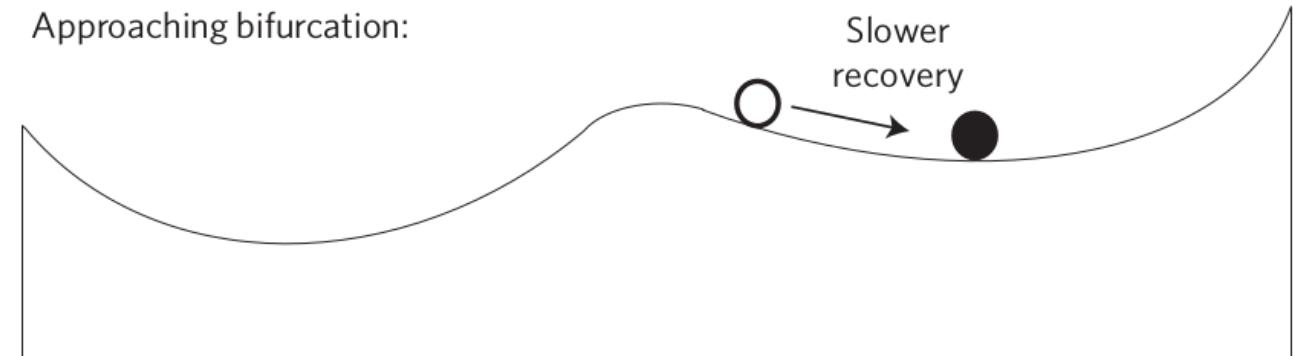
Recovery from small perturbations is slowed down in proximity to a bifurcation

Far from bifurcation:



Larger deviations

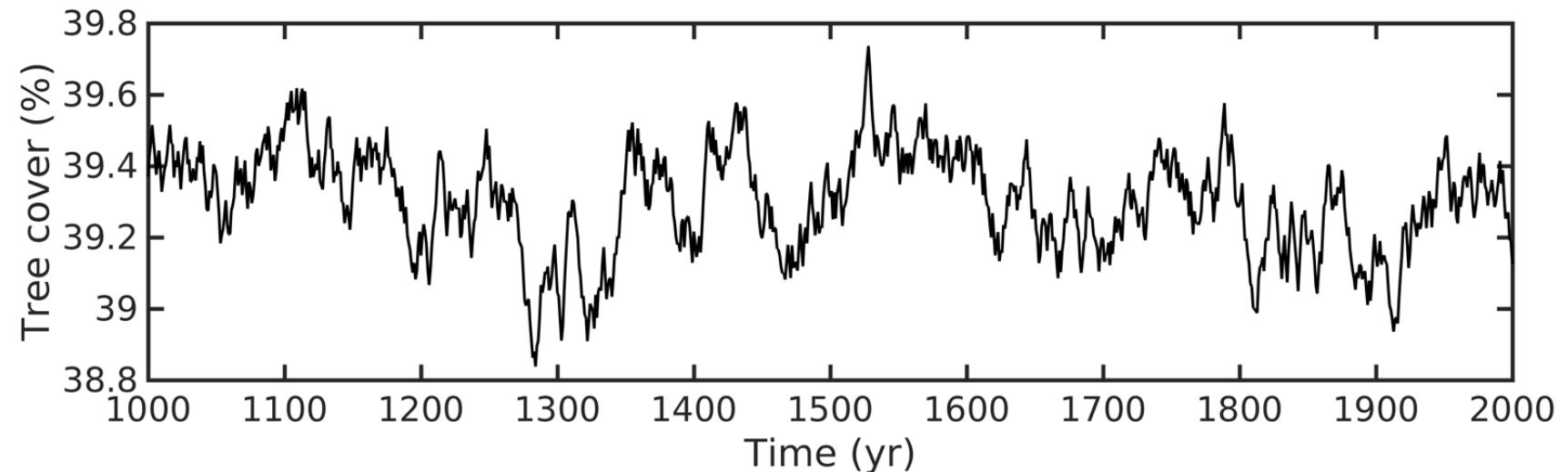
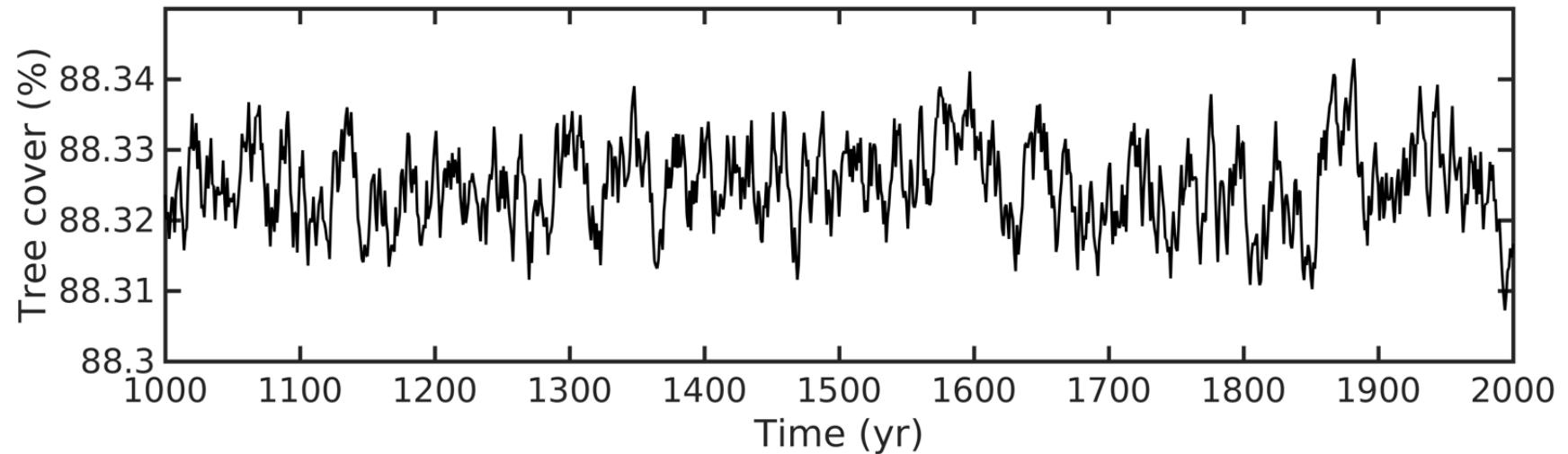
Approaching bifurcation:



Introducing an artificial perturbation

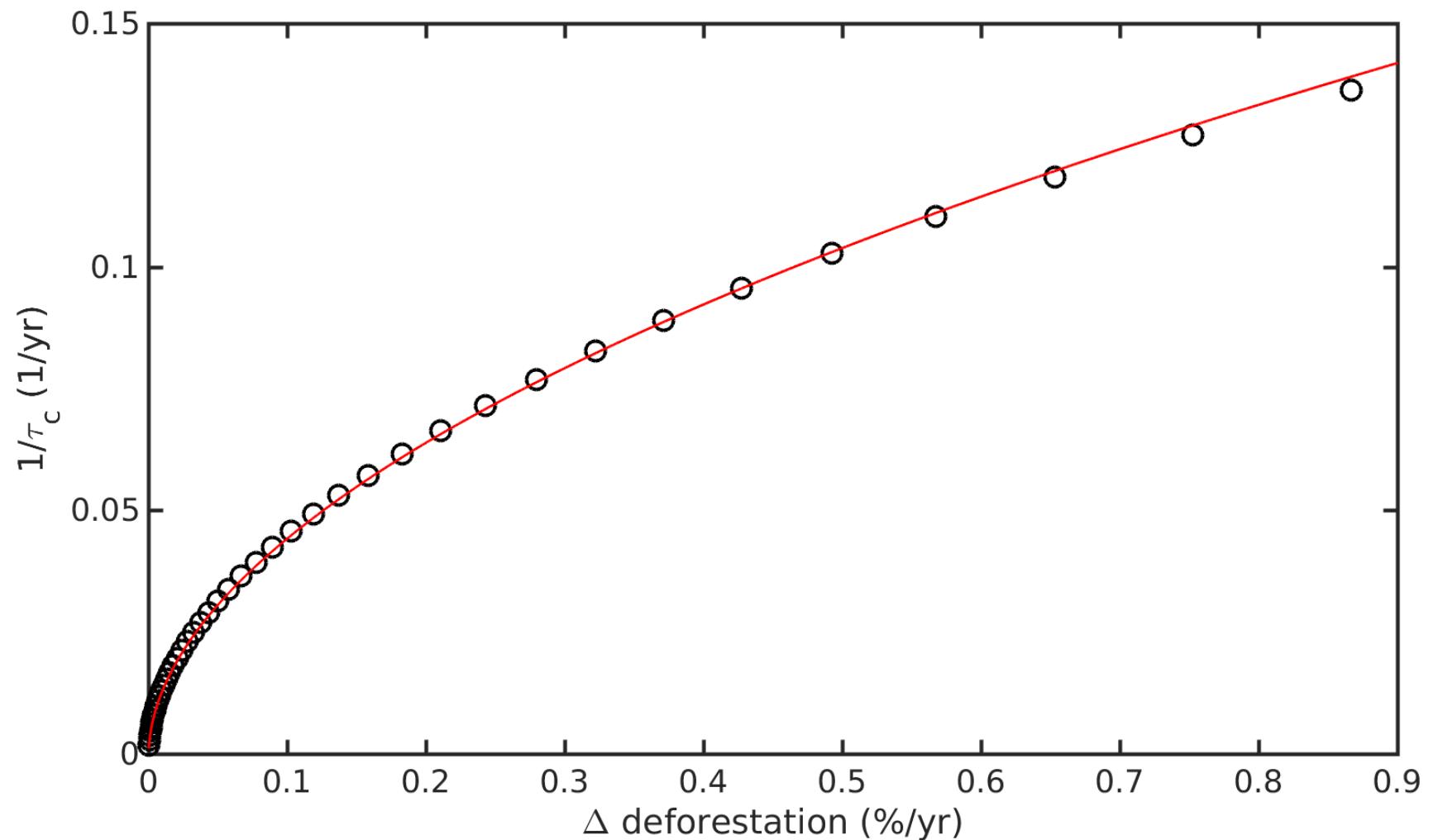
Much slower recovery rate close to the rainforest

→ savanna bifurcation



Recovery rate

Variation of the recovery rate as a function of the system state can be used to predict proximity to a bifurcation



Variation and autocorrelation

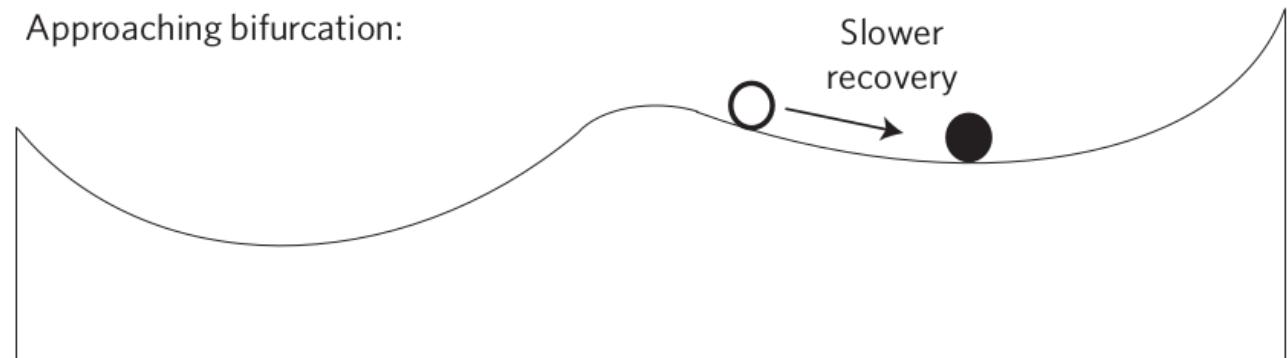
Both variation and autocorrelation under random perturbations are increased in proximity to a bifurcation

Far from bifurcation:



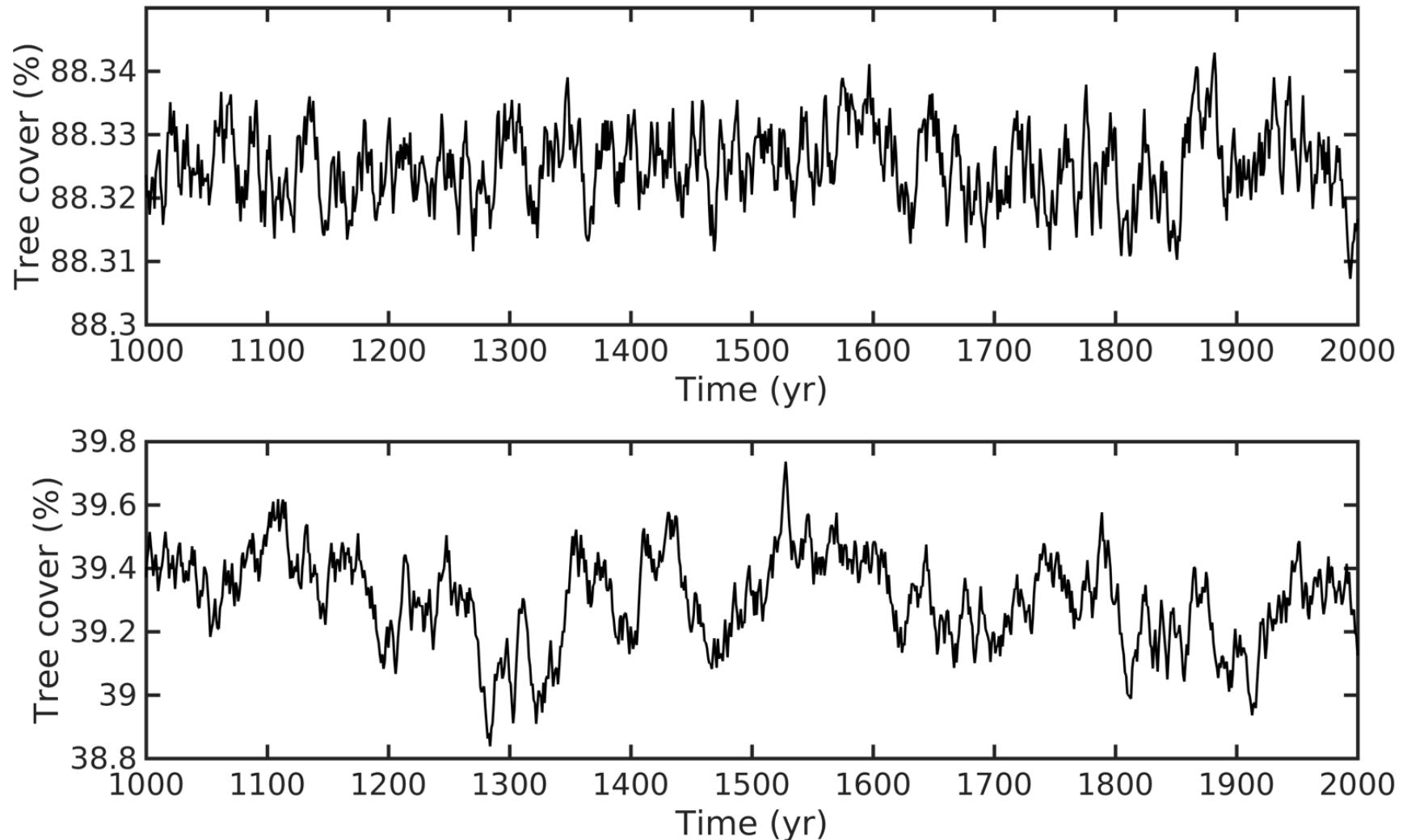
Larger deviations

Approaching bifurcation:



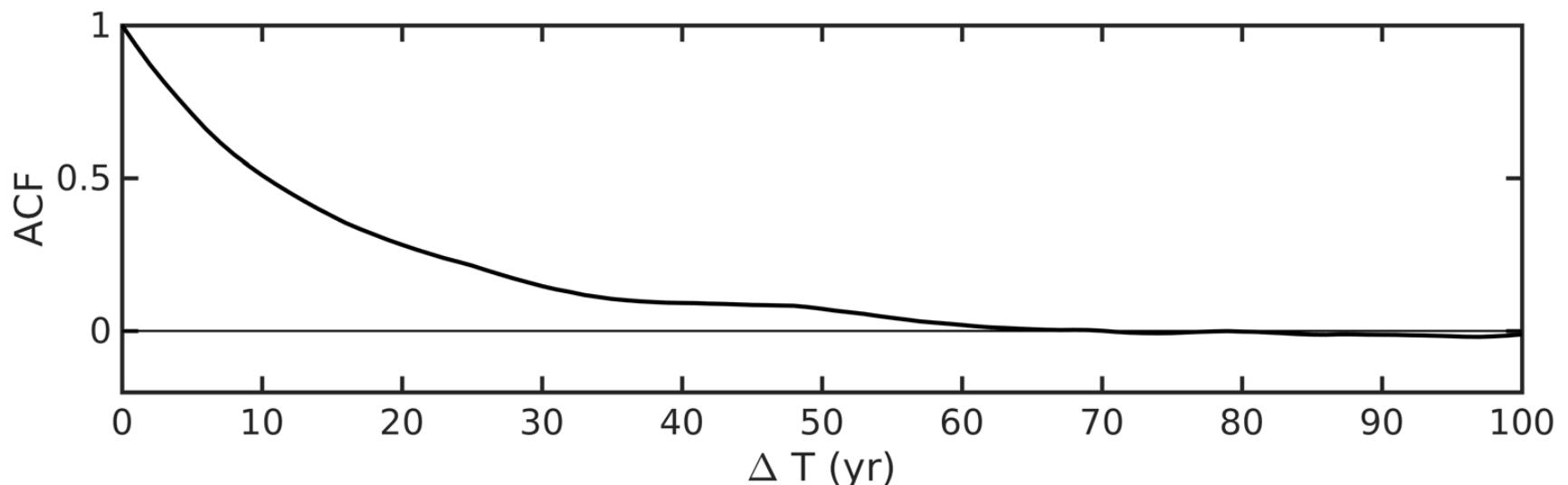
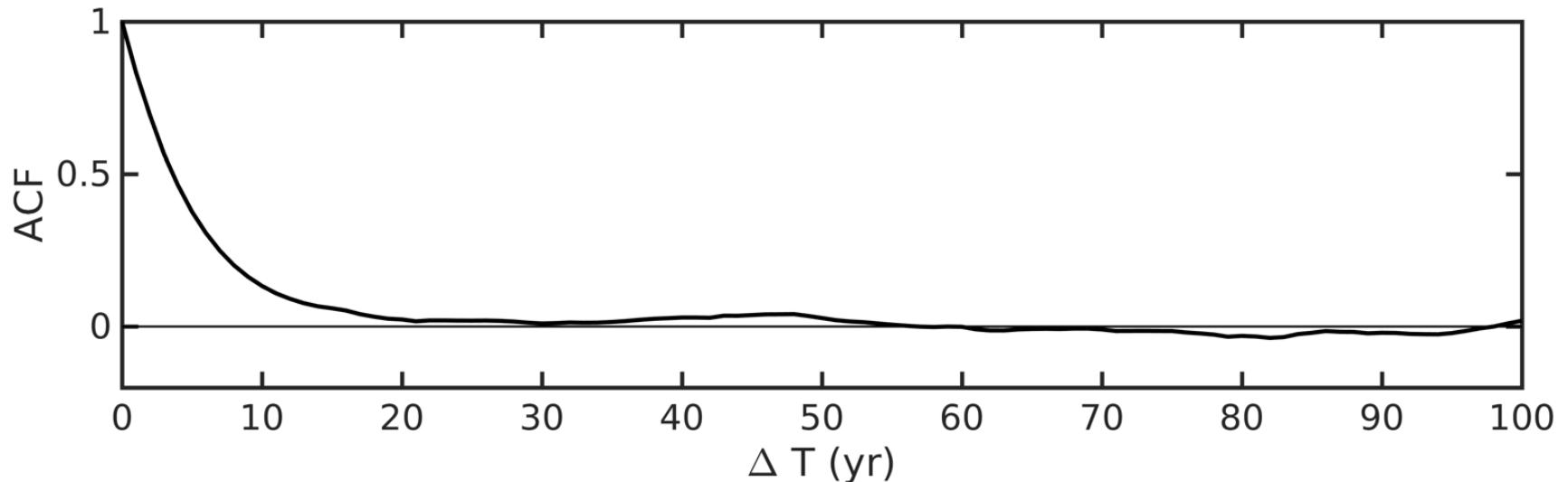
Variation and autocorrelation

Much higher variation and autocorrelation close
to the rainforest
→ savanna bifurcation



Autocorrelation function

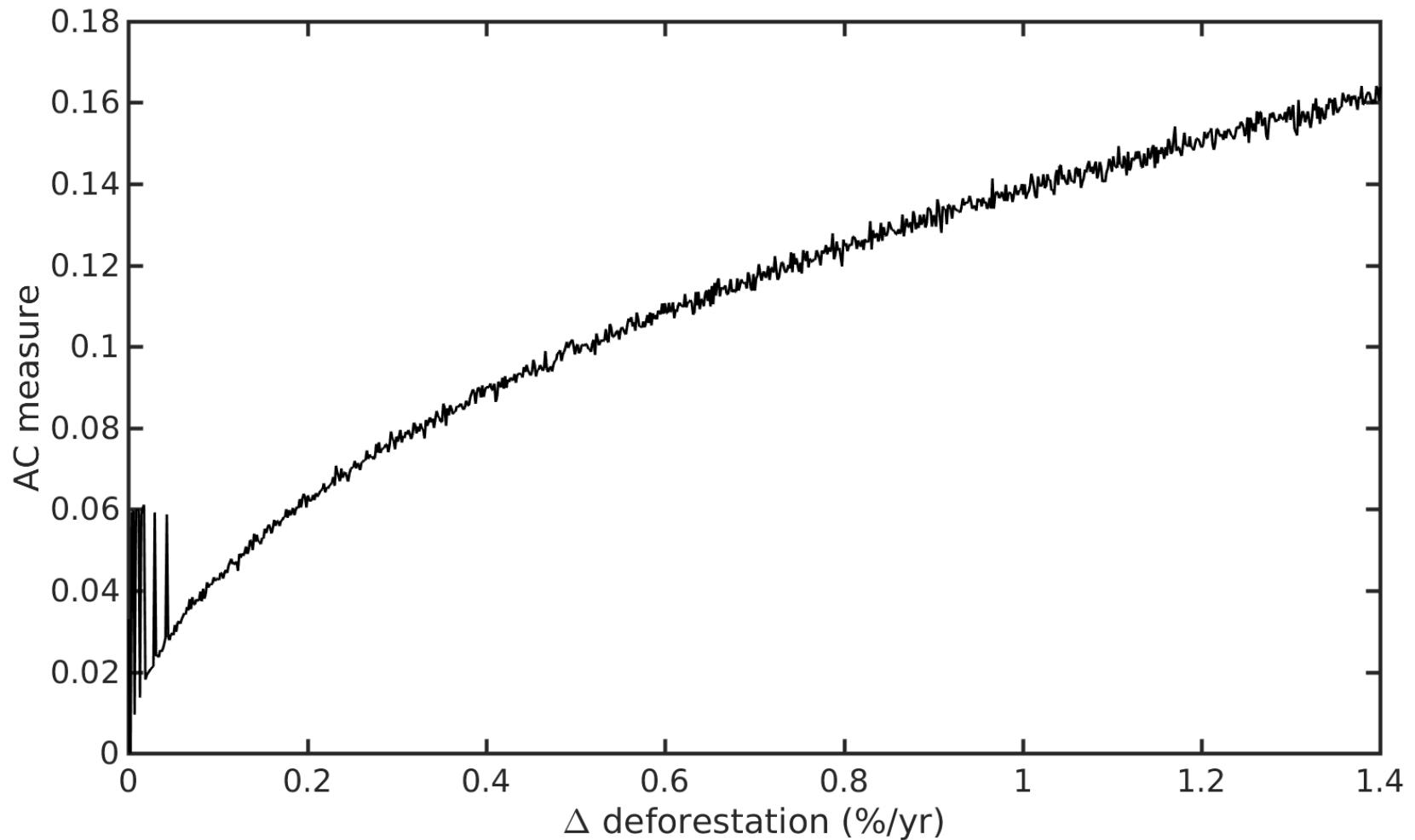
Slope of the autocorrelation function as a convenient measure



Autocorrelation

Theoretically, early warning of a bifurcation is possible,

Practical use of straightforward early warning signals is not robust, can be supplemented by detailed modeling effort



Thank you for your attention

References

- *Tipping points in tropical tree cover: linking theory to data*
Egbert H. van Nes et al., 2014

Pictures / Figures

- 1 - Ben Britten, *rainforest*, CC BY 2.0
- 2 - Michele Zanin, *Savanna in the morning*, CC BY-SA 2.0
- 3 - Gerben van Heijningen, *Desert*, CC BY-NC 2.0
- 4 - *Early warning of climate tipping points*,
Timothy M. Lenton, Nature Climate Change volume 1, pages 201-209 (2011),
Figure 1.