



POTSDAM INSTITUTE FOR
CLIMATE IMPACT RESEARCH

Dynamics of cascading failures on networks: Measuring vulnerability in connected systems

Environmental transformations in the Amazon rainforest

Nico Wunderling

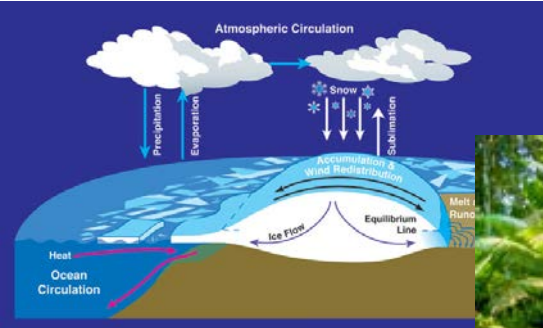
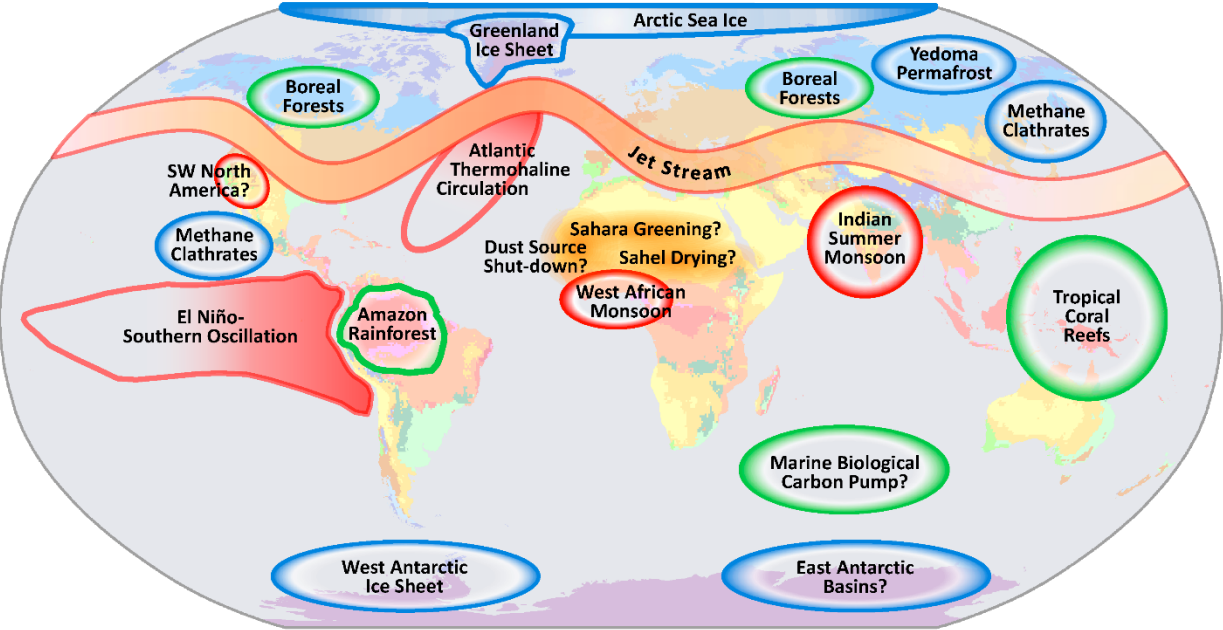
Instituto de Física USP, São Paulo – 07.02.2020



Nico.Wunderling@pik-potsdam.de



Tipping elements in the climate system



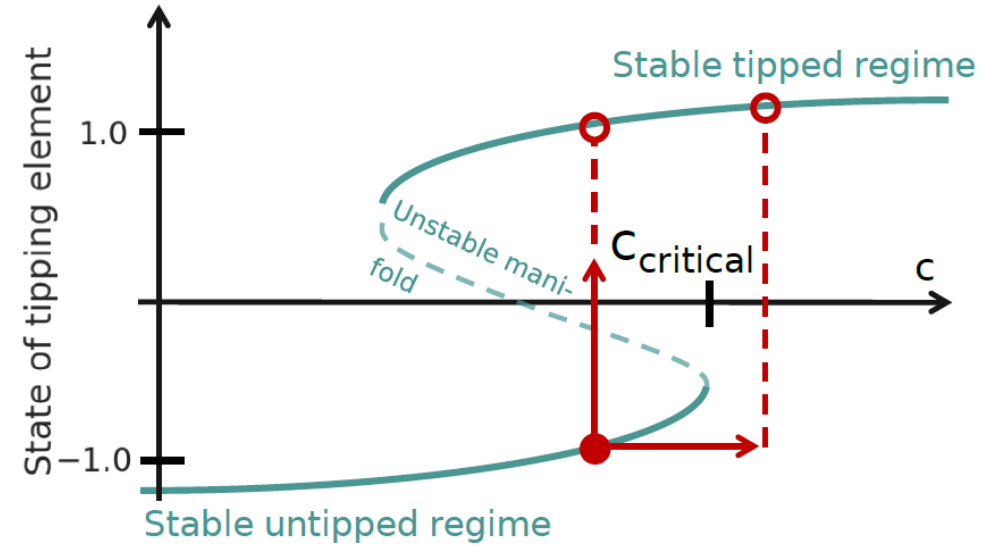
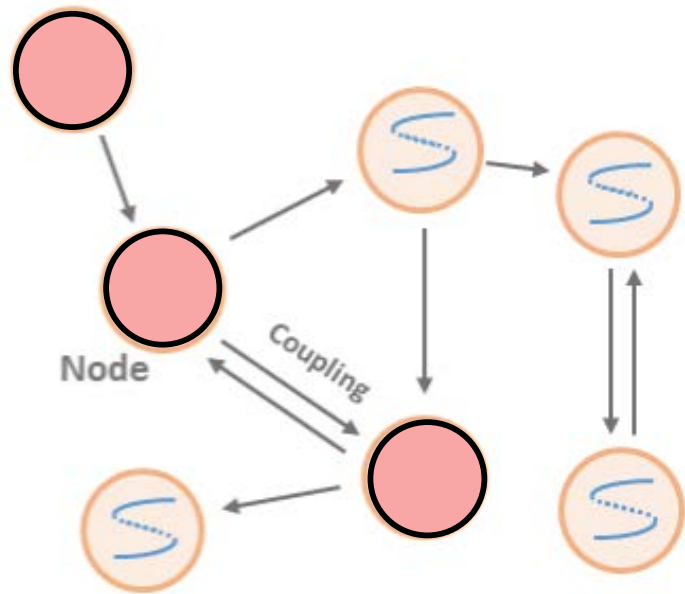
- Cryosphere Entities
 - Circulation Patterns
 - Biosphere Components
- Köppen Climate Classification
- Ar Am Aw As BS BW Cr Cs Cw Do Dc Eo Ec FT FI

www.pik-potsdam.de/services/infodesk/tipping-elements

Tipping elements are systems, where a small perturbation can be sufficient to induce a qualitative change of the whole system as soon as a critical value (tipping point) is approached.



Networks of connected tipping elements



$$\frac{dx_i}{dt} = \underbrace{-a(x_i - x_0)^3 + b(x_i - x_0) + c_i}_{\text{Individual dynamics}}$$

x_i = state of tipping element
 x_0 = shift
 c_i = critical value
 d = coupling strength
 $a_{ij} = 1$, if connection between nodes exists, 0 otherwise

Krönke, Wunderling et al. (PRE, in review)

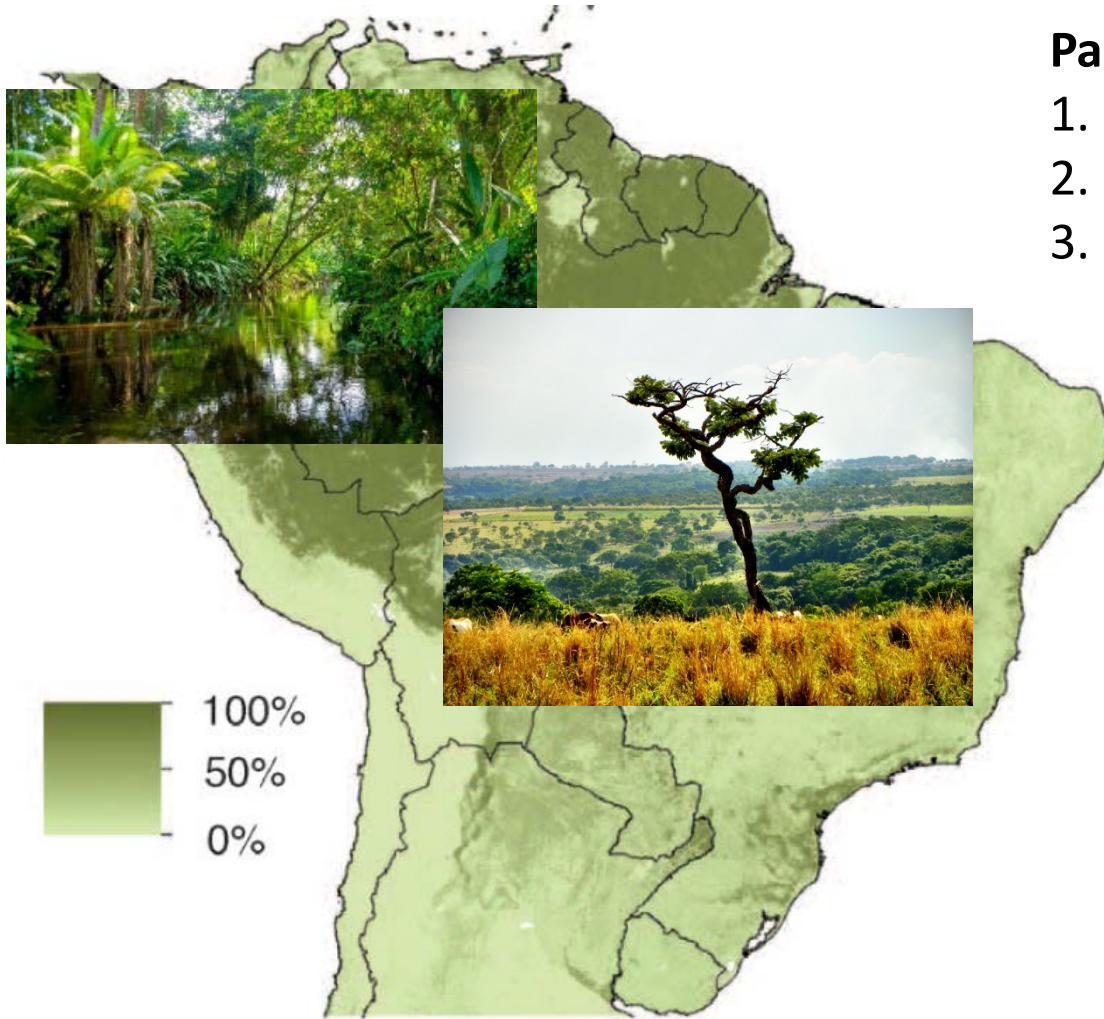
The Amazon rainforest as a tipping element: Network approaches to environmental transformations



Thanks to contributors:

A. Staal, B. Sakschewski, K. Thonicke, HMJ. Barbosa, JF. Donges & R. Winkelmann

The Amazon rainforest as a tipping element



Parameters influencing the Amazon adversely (among others):

1. Droughts (Seasonal, Annual precipitation patterns)
2. Fire & Deforestation (Natural, Anthropogenic)
3. Climate Change (Adaptation to new environmental conditions)



Source: BBC (drought 2010)



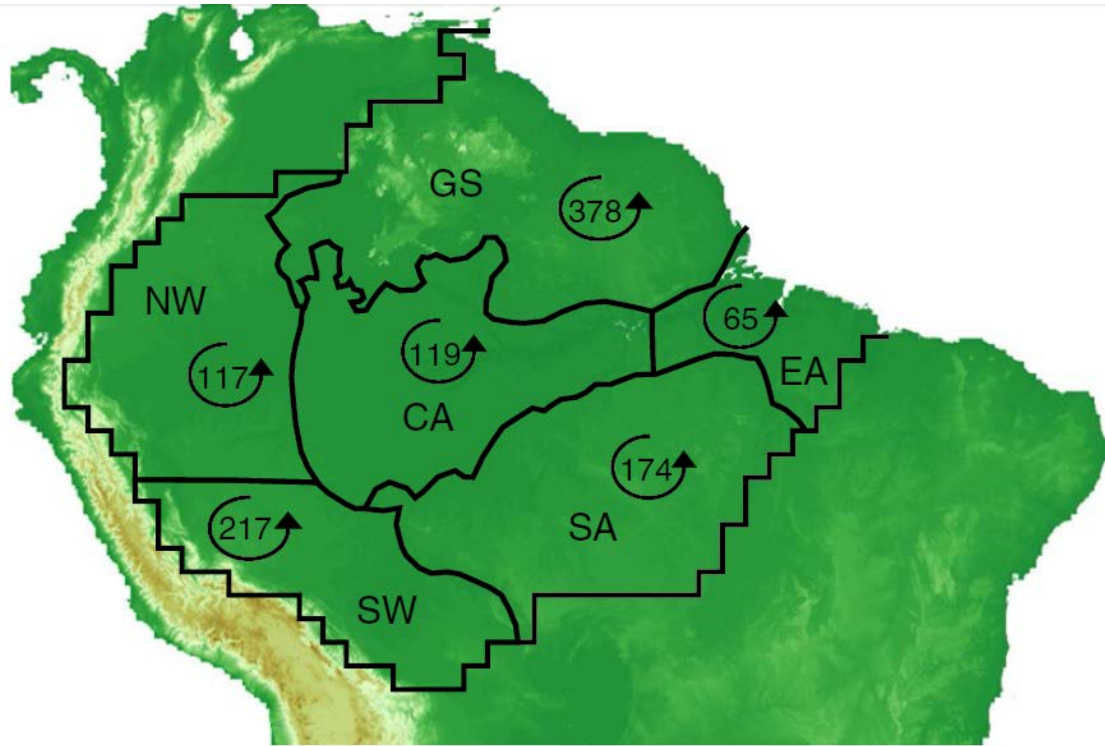
Source: BBC (forest fire 2019)



Source: BBC (deforestation 2019)

Hirota, M., et al. (2011). *Science*

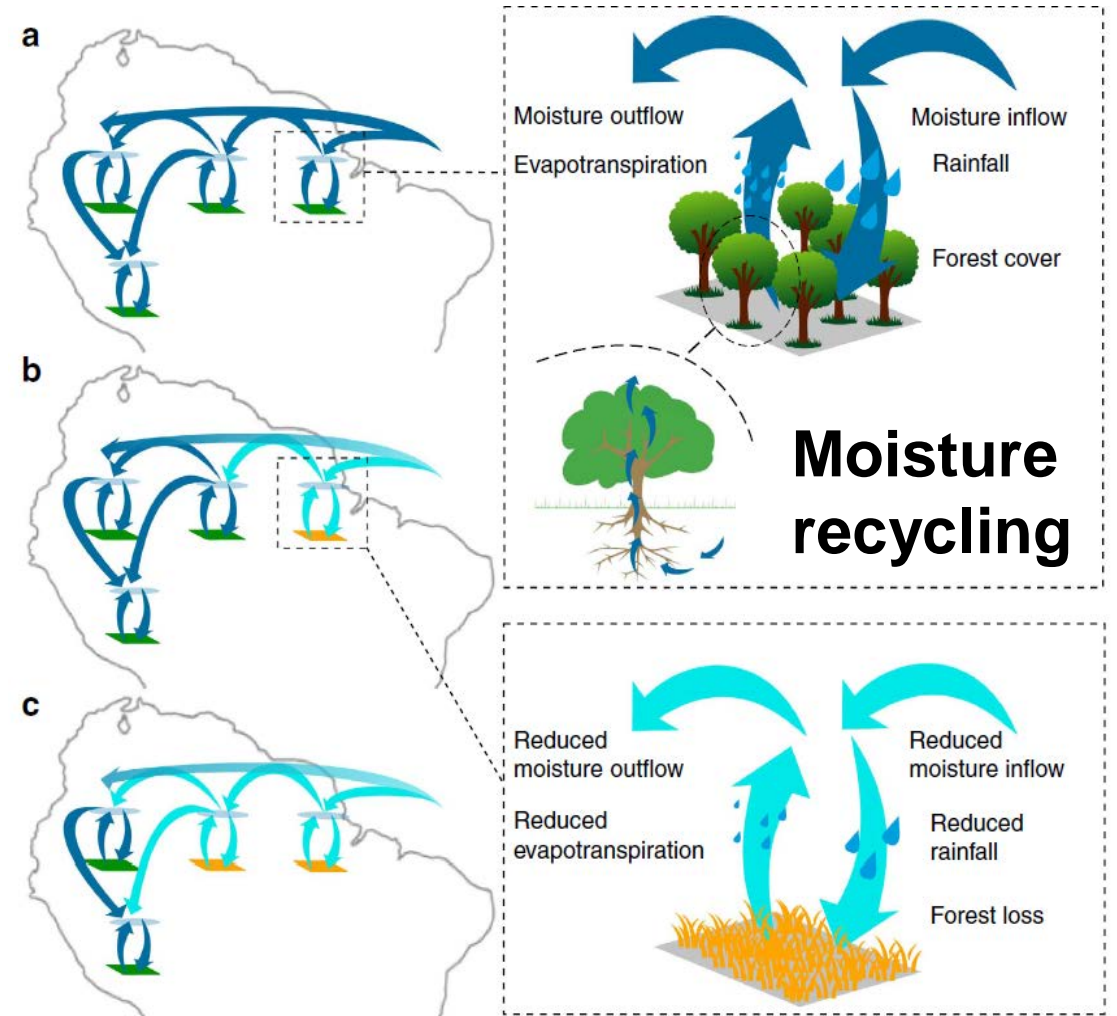
The Amazon rainforest as a tipping element



Staal, A., et al. (2018). *Nature Climate Change*

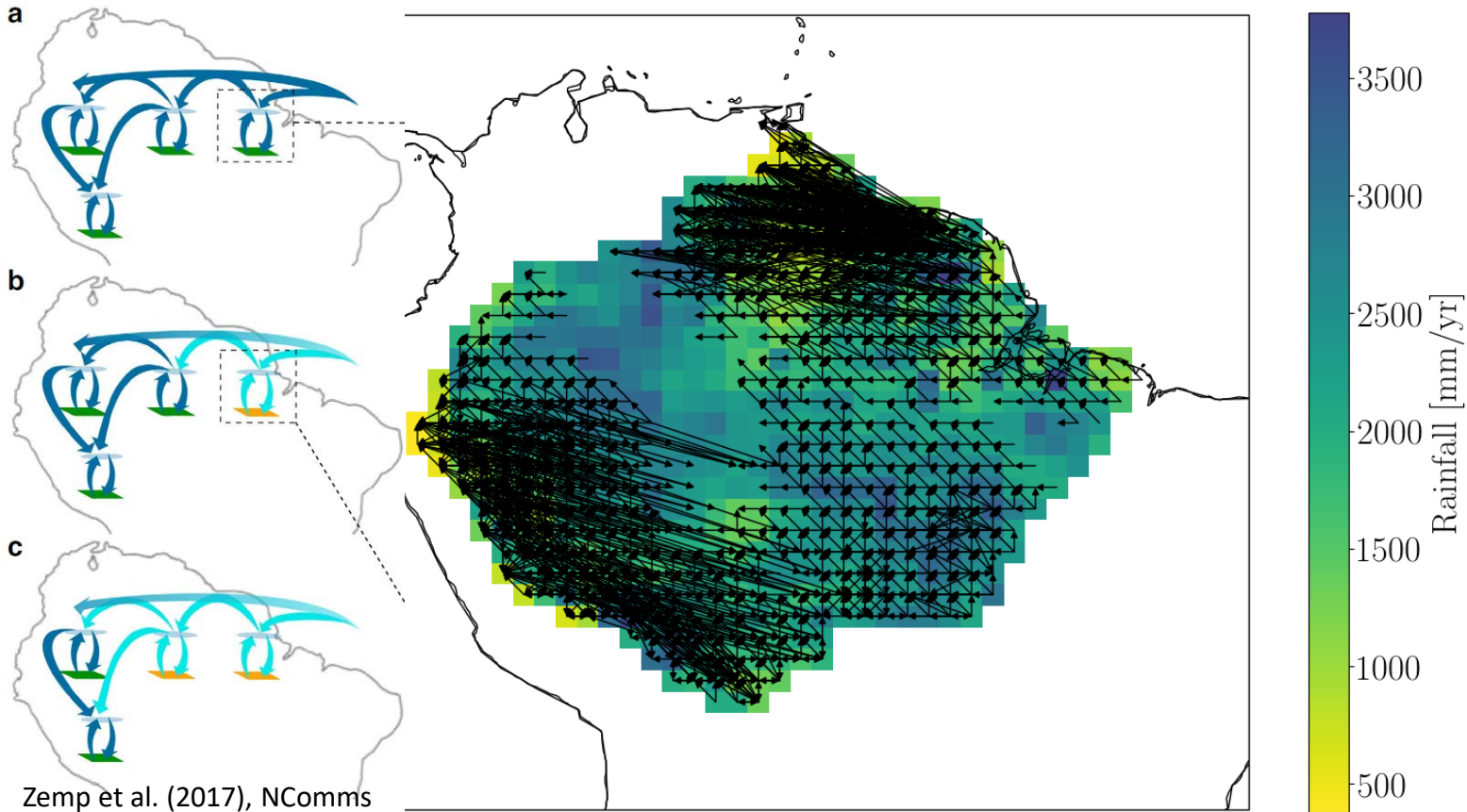
Note:

Regions within the Amazon are **dependent** on each other due to moisture transport



Zemp et al. (2017), *Nature Communications*

Networks of tipping elements



Zemp et al. (2017), NComms

Input:

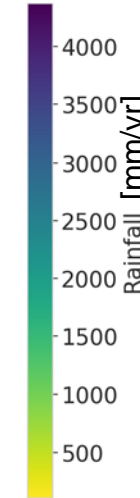
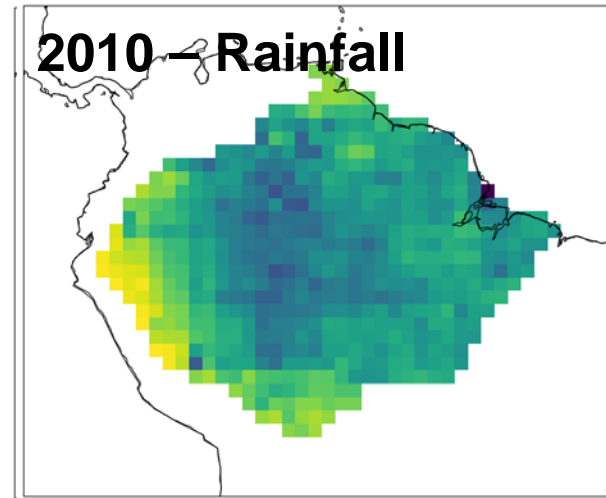
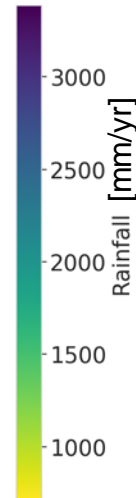
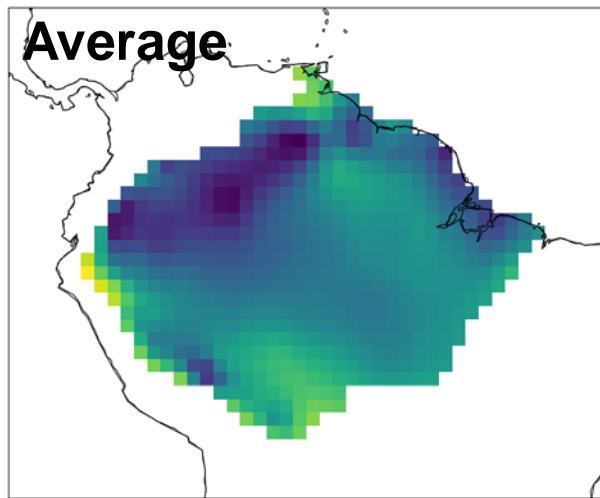
1. Rainfall of the specific cell
2. Moisture recycling network from GLDAS (2003-2014, Staal et al., 2018)

Which regions of the Amazon rainforest are most vulnerable?

Setup: Each node is a tipping element

1. Two stable states exist: Rainforest or a savanna/treeless state
2. Critical variables: Mean annual precipitation & drought index (MCWD)

Stability against droughts: When does the rainforest tip?

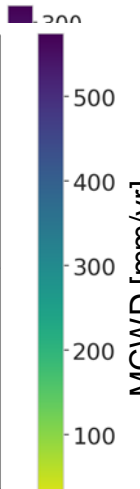
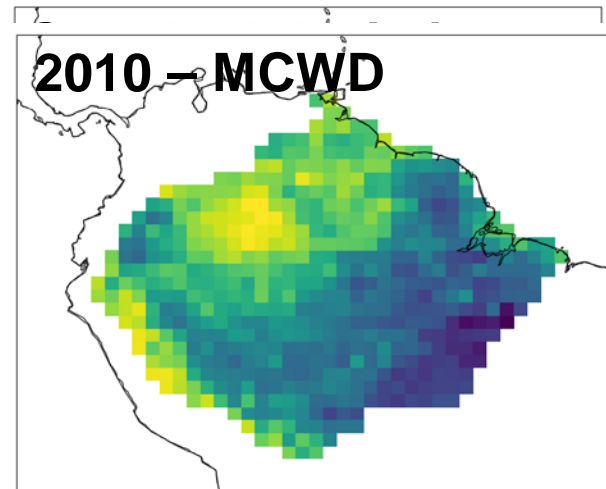
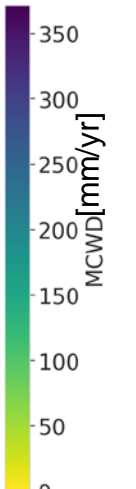
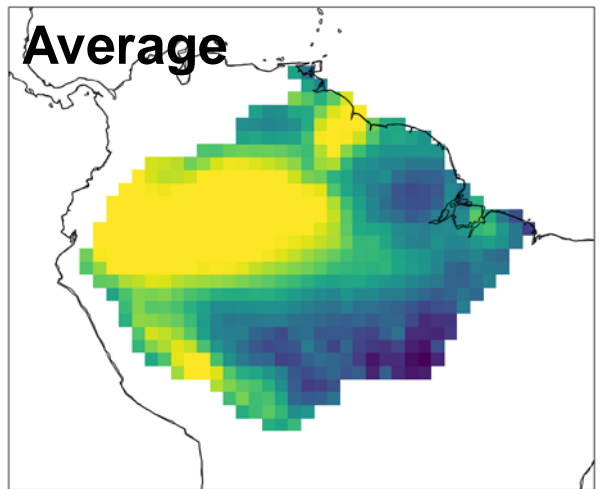


Assumption:

Rainforest is adapted to past conditions

Past conditions (from GLDAS 1973-2002):

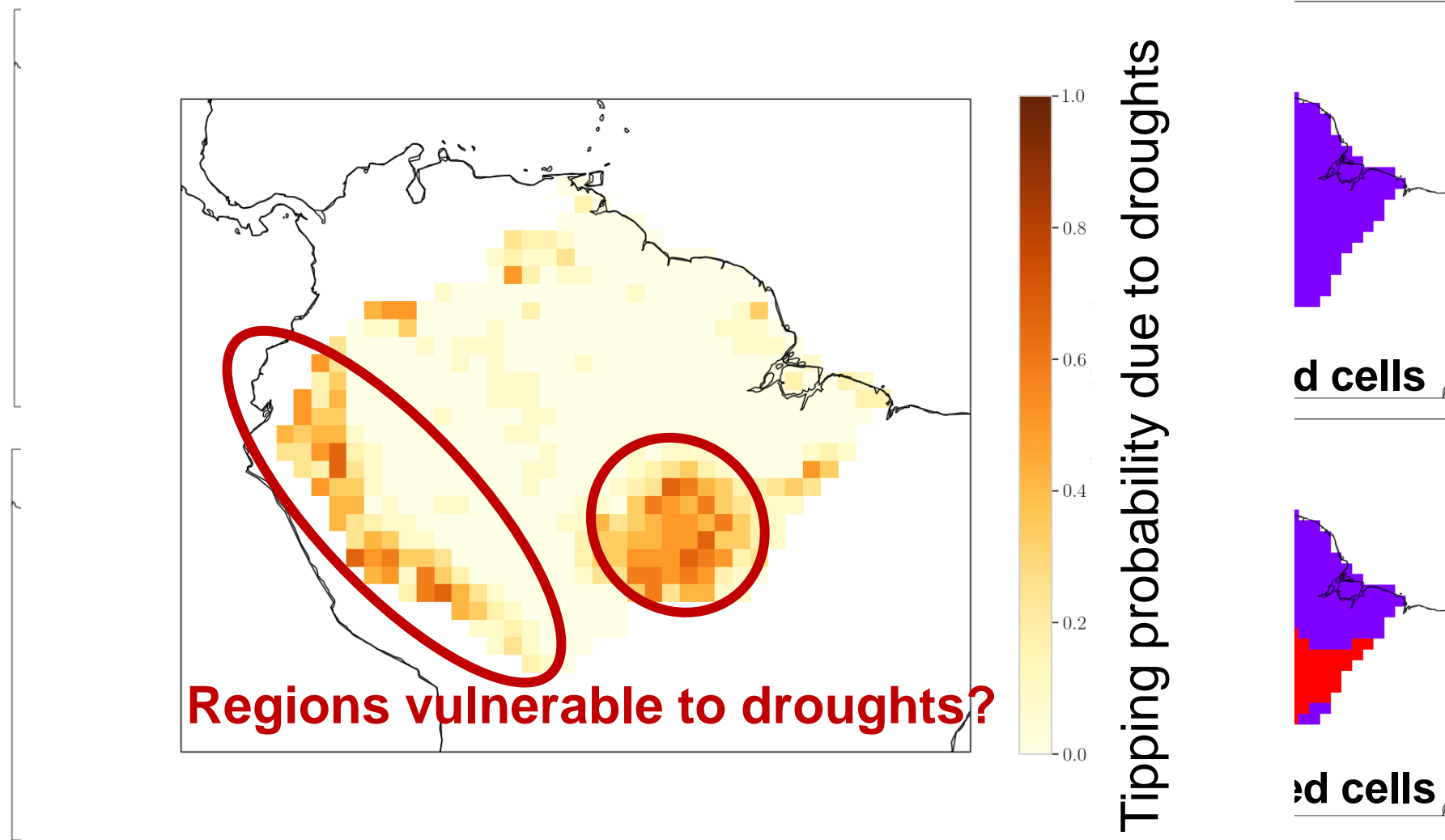
- Mean annual precipitation (Rainfall)
- Drought index (MCWD)



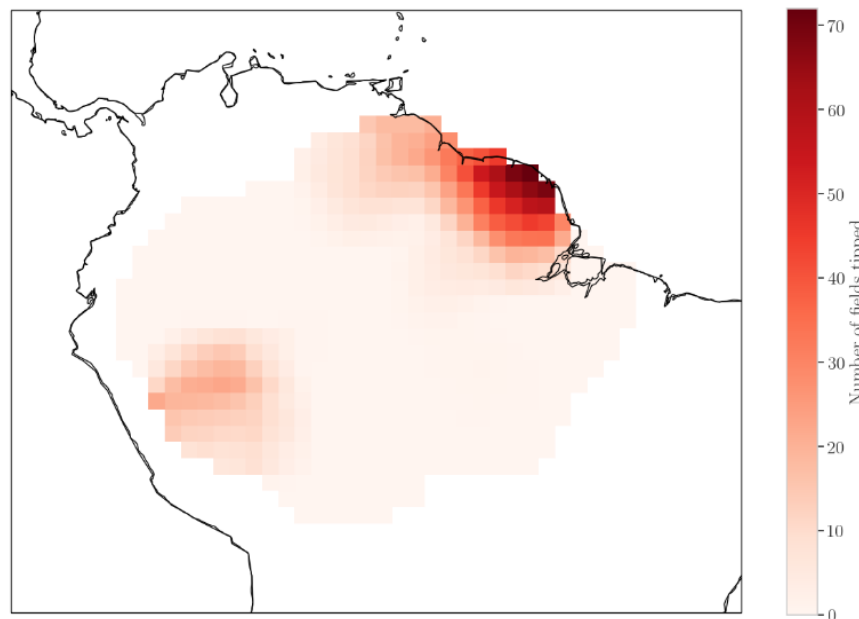
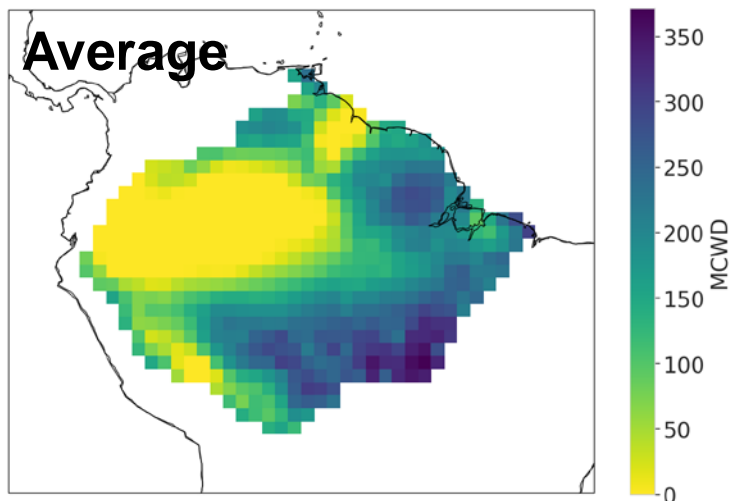
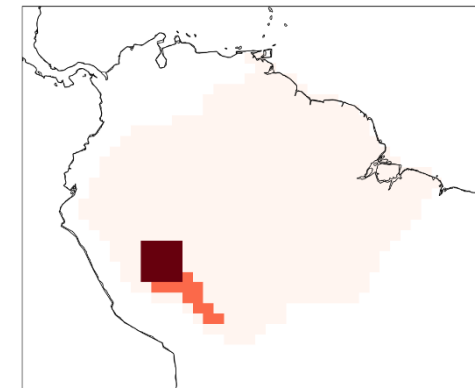
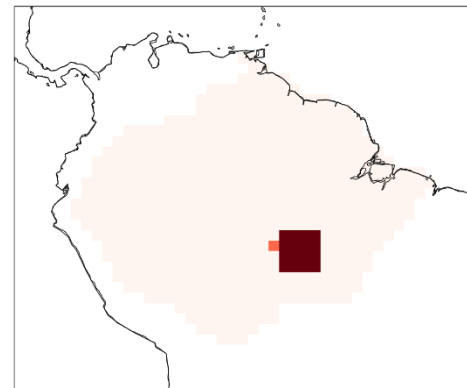
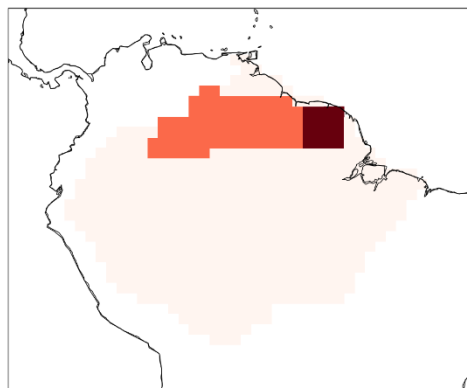
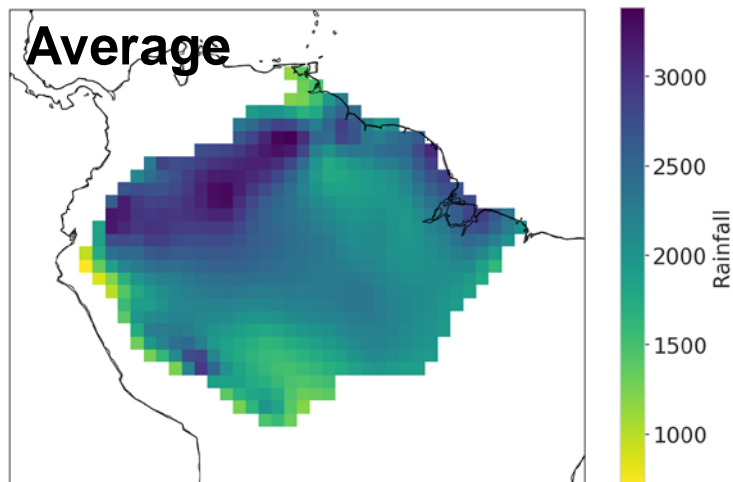
Tipping rule:
Average – 2 Standard Deviations

Evaluation data:
2003-2014: Rainfall, drought index,
Moisture transport network

Stability against droughts: When does the rainforest tip?



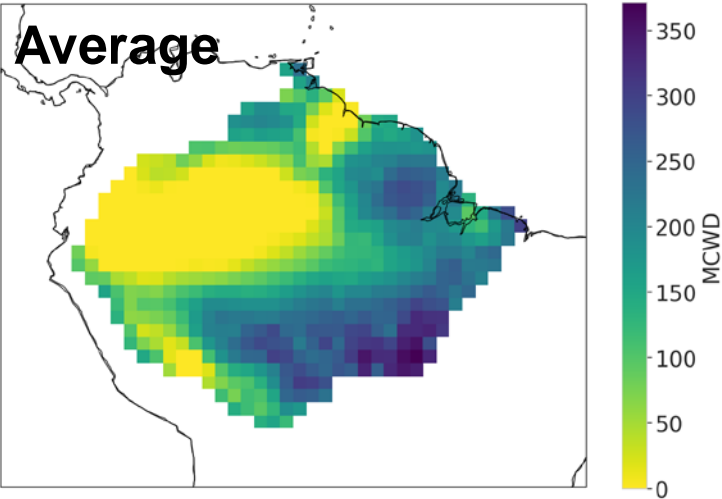
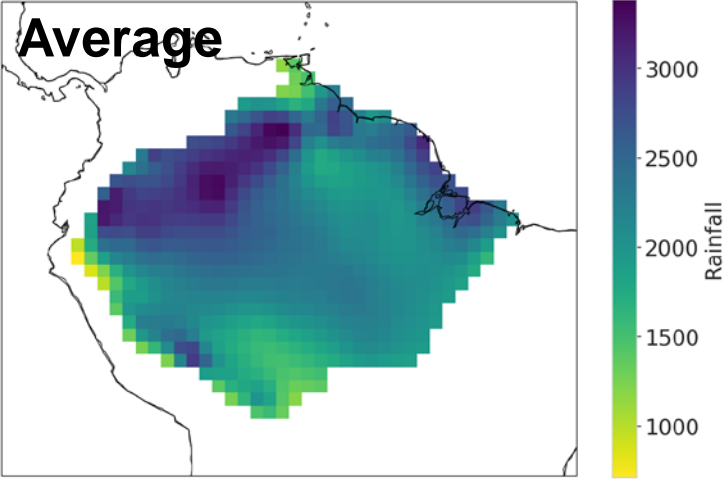
Stability against perturbations in forest cover?



Vulnerability map due to removal of forest patch



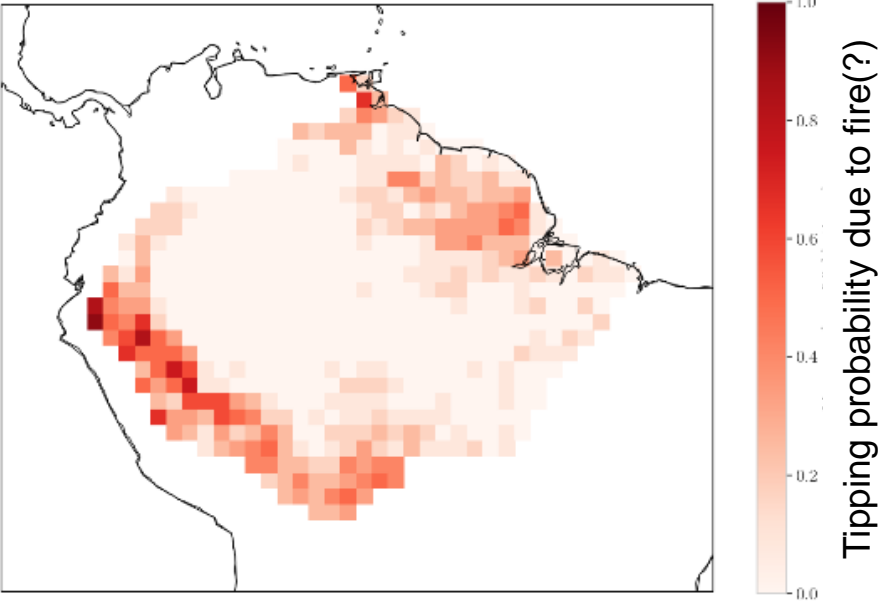
Stability against fixed thresholds



Old tipping rule:
Average – 2 Standard Deviations

New tipping rule:

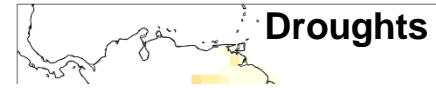
- i) Mean annual rainfall below 1000 mm/yr
- ii) MCWD > 350 mm/yr





**I think I got it,
but just in case
I will explain it
once more**

Conclusion



1. Investigation of tipping cascades on the Amazon rainforest with adaptive thresholds to

- Adaptive thresholds (Droughts)
- Removal of forest cover (Deforestation?)
- Fixed thresholds (Fire?)

2. Github package available to simulate tipping cascades on networks

29 commits 2 branches 0 releases 2 contributors

Branch: master New pull request Create new file Upload files Find file Clone or download

jkroenke Add adjust_normal_pars method to tipping_network class and renamed in... Latest commit 462ee17 13 days ago

modules	Add adjust_normal_pars method to tipping_network class and renamed in...	13 days ago
scripts	Add adjust_normal_pars method to tipping_network class and renamed in...	13 days ago
tests	Add small info texts about directories.	a month ago
.gitignore	Add net_factory module.	26 days ago
README.md	Update README.md	a month ago

PyCascades

Python framework for simulating tipping cascades on complex networks

Project Structure

The project consists of a modules directory where classes and functionalities are defined. The contents of this directory are meant to be very general and reusable for similar purposes. Additionally there is a scripts and a tests directory. These directories can be used to write concrete scripts that run physically meaningful simulations to solve special problems and conduct tests to verify the functionality of the content of the modules directory. The contents of these directories are not meant to have dependencies among each other and self defined modules should only be imported from the modules directory.

Github repository



The Amazon rainforest as a tipping element: Network approaches to environmental transformations



Thank you!



Contact:
Nico.Wunderling@pik-potsdam.de



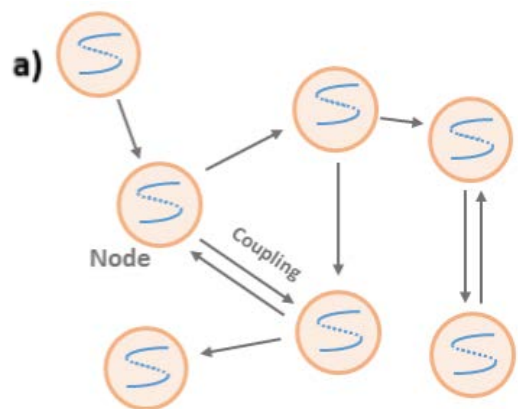
Literature

1. Krönke, J., **Wunderling, N.**, Winkelmann, R., Staal, A., Tuinenburg, O., Donges, J.F., Dynamics of tipping cascades in complex networks (PRE in review)
2. **Wunderling, N.***, Stumpf, B.*, Krönke, J., Staal, A., Tuinenburg, O., Winkelmann, R. & Donges, J.F., Linking Micro to Macro: How motifs condition critical thresholds in complex networks (Chaos, in review),
*These authors share the first authorship
3. **Wunderling, N.**, Donges, J.F., Kurths, J., Winkelmann, R., Interacting tipping elements increase risk of climate domino effects (submitted)
4. Donges, J.F., **Wunderling, N.**, Kurths, J., Winkelmann, Risk analysis approach for tipping cascades and domino effects in the Earth system under global warming (in prep.)
5. **Wunderling, N.**, Staal, A., Sakschewski, B., Thonicke, K., Barbosa, H.M.J., Donges, J. F., Winkelmann, R., The Amazon rainforest – Vulnerability due to droughts (in prep.)

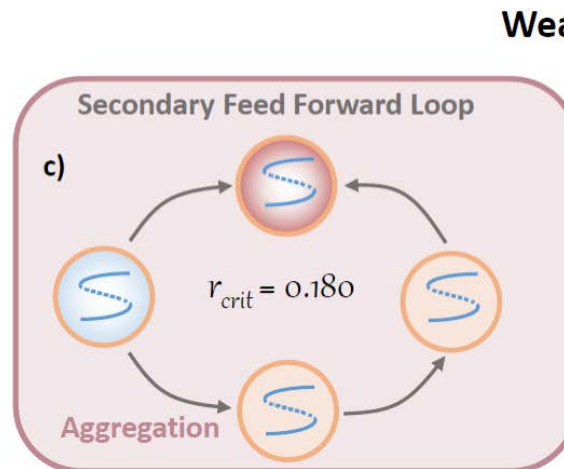
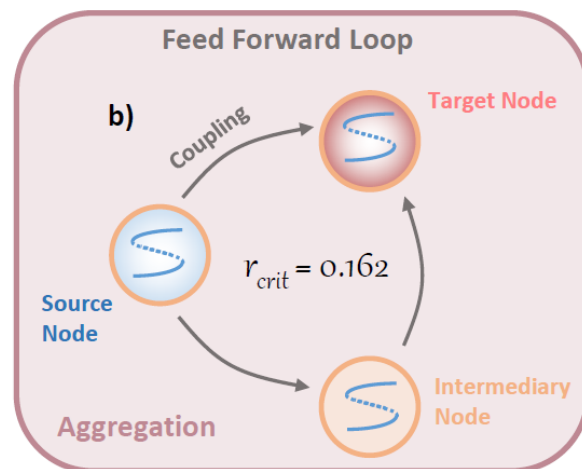
Further literature

1. Staal, A., Tuinenburg, O.A., Bosmans, J.H., Holmgren, M., van Nes, E.H., Scheffer, M., Zemp, D.C. and Dekker, S.C., 2018. Forest-rainfall cascades buffer against drought across the Amazon. *Nature Climate Change*, 8(6), p.539.
2. Zemp, D.C., Schleussner, C.F., Barbosa, H.M., Hirota, M., Montade, V., Sampaio, G., Staal, A., Wang-Erlandsson, L. and Rammig, A., 2017. Self-amplified Amazon forest loss due to vegetation-atmosphere feedbacks. *Nature communications*, 8, p.14681.
3. Hirota, M., Holmgren, M., Van Nes, E.H. and Scheffer, M., 2011. Global resilience of tropical forest and savanna to critical transitions. *Science*, 334(6053), pp.232-235.
4. Lenton, T.M. and Williams, H.T., 2013. On the origin of planetary-scale tipping points. *Trends in Ecology & Evolution*, 28(7), pp.380-382.
5. Kriegler, E., Hall, J.W., Held, H., Dawson, R. and Schellnhuber, H.J., 2009. Imprecise probability assessment of tipping points in the climate system. *Proceedings of the national Academy of Sciences*, 106(13), pp.5041-5046.
6. Schellnhuber, H.J., Rahmstorf, S. and Winkelmann, R., 2016. Why the right climate target was agreed in Paris. *Nature Climate Change*, 6(7), p.649.
7. Hirota, M., Holmgren, M., Van Nes, E.H. and Scheffer, M., 2011. Global resilience of tropical forest and savanna to critical transitions. *Science*, 334(6053), pp.232-235.
8. Lenton, T.M., Held, H., Kriegler, E., Hall, J.W., Lucht, W., Rahmstorf, S. and Schellnhuber, H.J., 2008. Tipping elements in the Earth's climate system. *Proceedings of the national Academy of Sciences*, 105(6), pp.1786-1793.

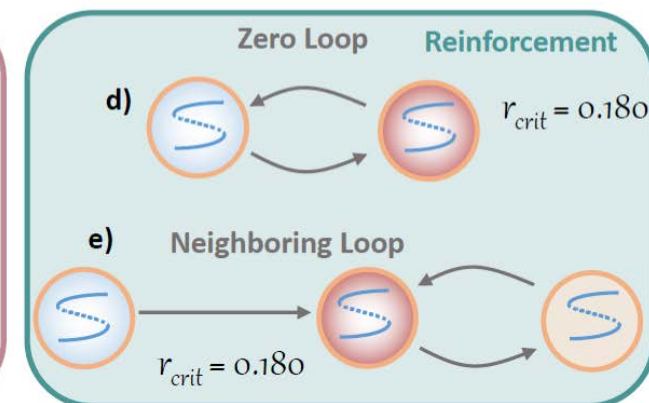
Structures of vulnerability: The notion of motifs



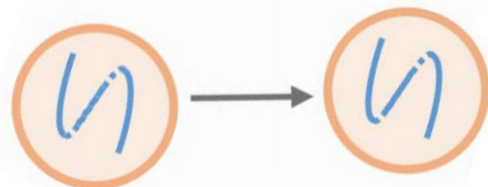
Wunderling, Stumpf et al. (Chaos, in review)



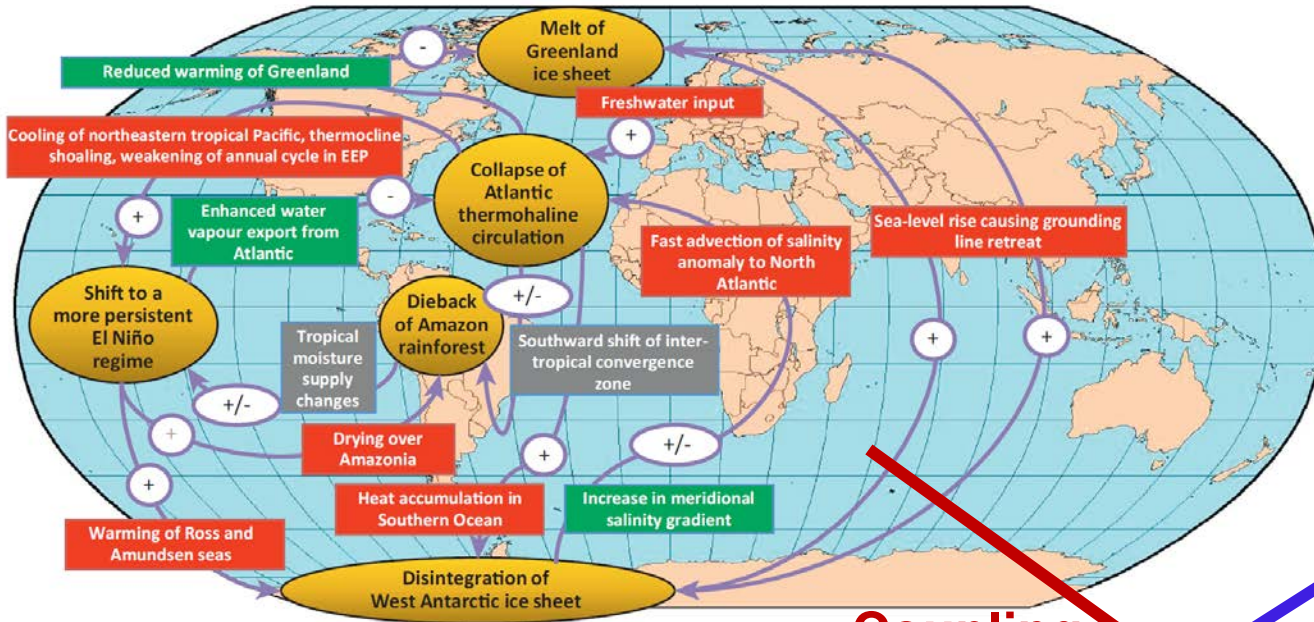
Weak Motifs



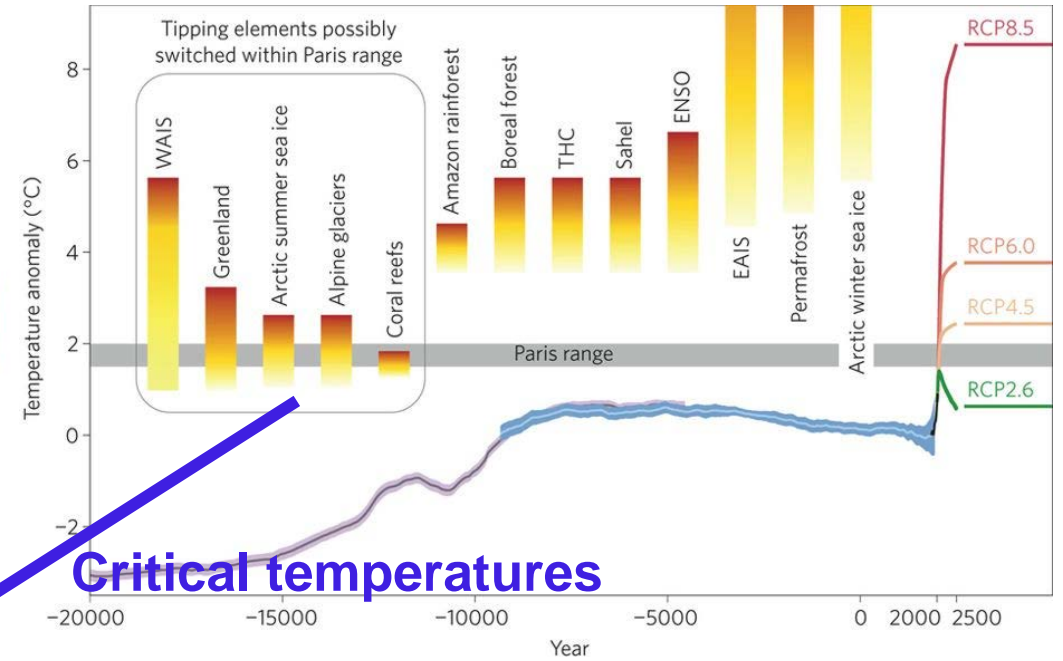
$$r_{crit} = 0.182$$



Risk of domino effects in the Climate system



Lenton & Williams (2013)



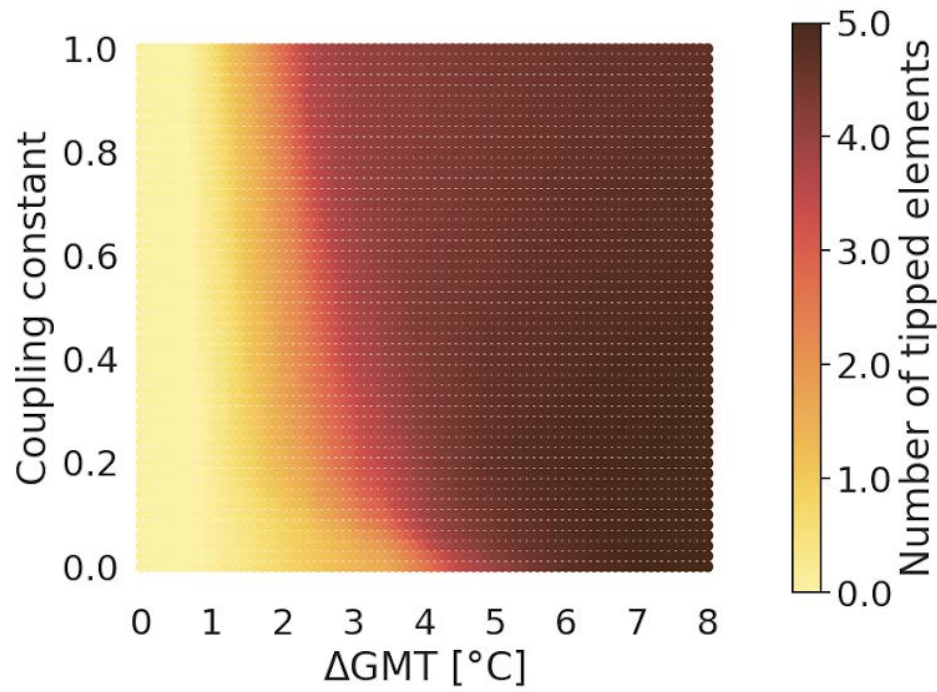
Schellnhuber et al. (2016)

Coupling

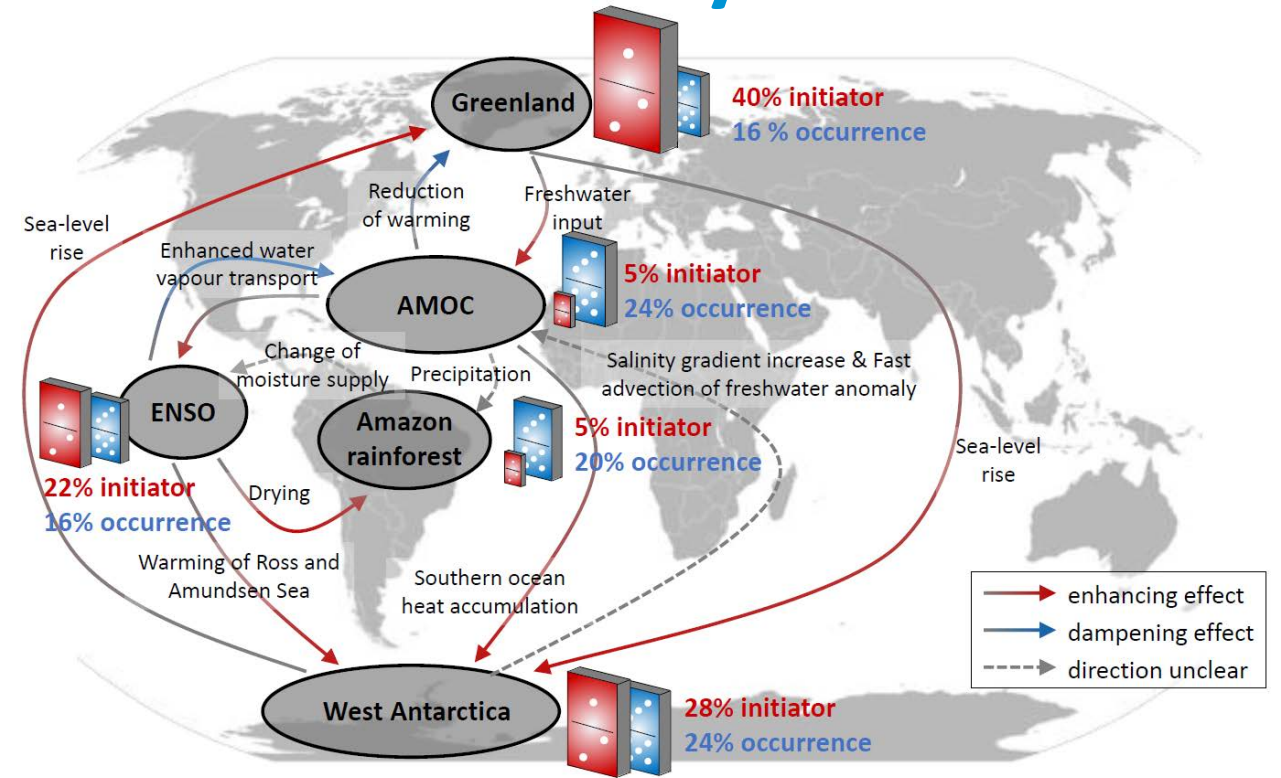
Critical temperatures

$$\frac{dx_i}{dt} = -a(x_i - x_0)^3 + b(x_i - x_0) + c_i + d \sum_{\substack{j \\ j \neq i}} a_{ij}(x_j - x_0)$$

Risk of domino effects in the Climate system



Donges, Wunderling, Kurths, Winkelmann (in prep.)



Wunderling, Donges, Kurths, Winkelmann (submitted)

- 1) Find **roles of tipping elements** within cascades
- 2) Determine **vulnerability** of climate tipping elements
- 3) **Risk analysis** approach with complex networks