

How should resilience be quantified?  
Is there a context independent metric?

Ingrid van de Leemput

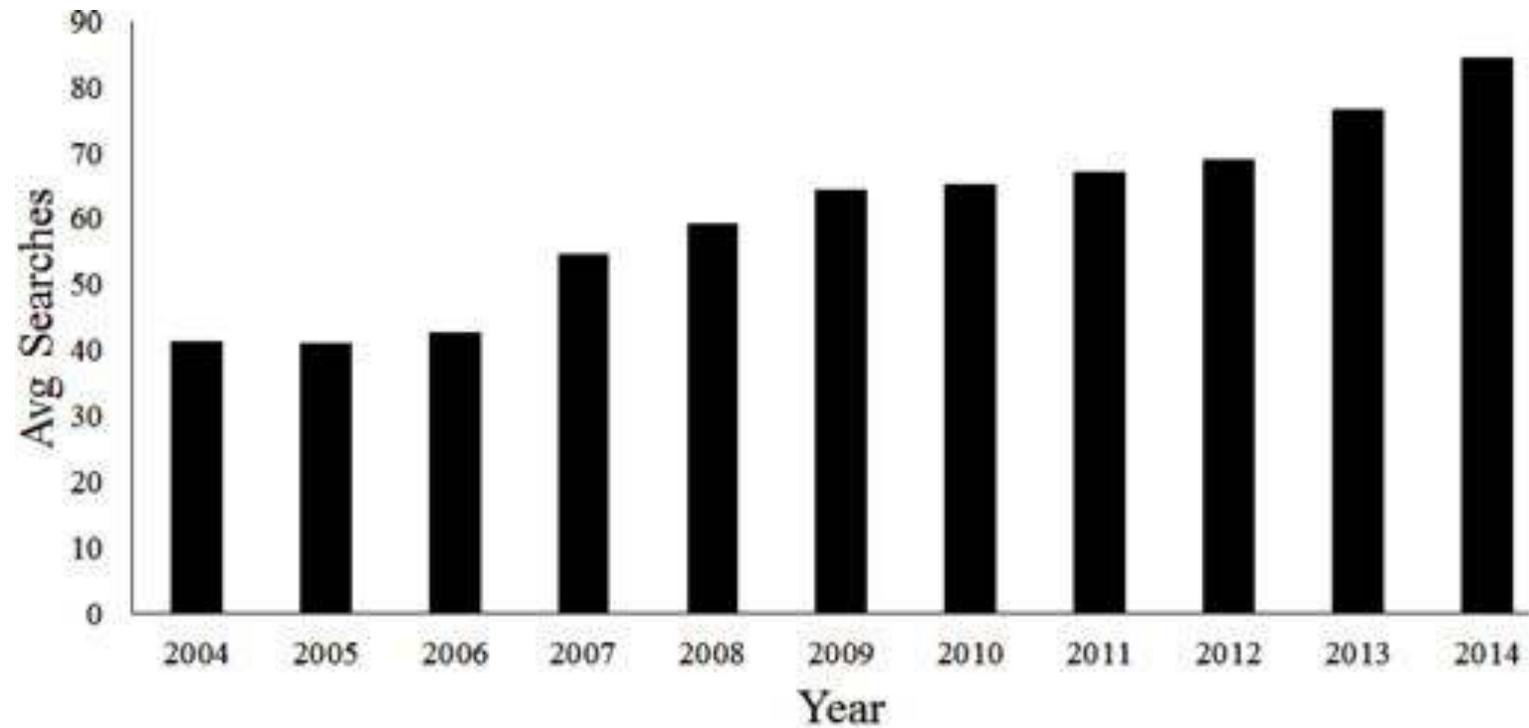
Session 1. Workshop Resilience of Complex Systems

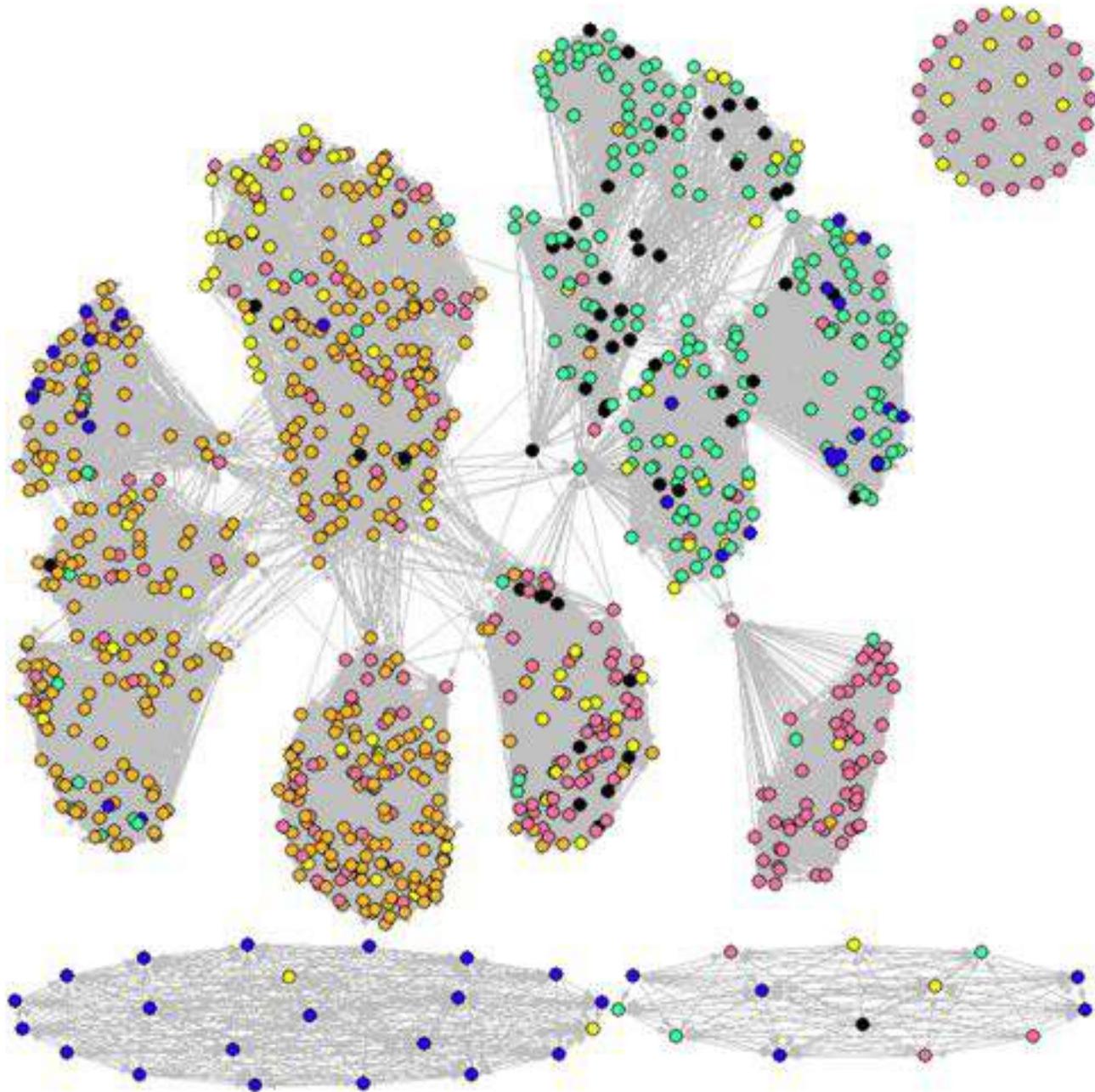


# Teaser session 1

- What is 'resilience'?
- Ecological resilience
- What makes a system resilient?
- Quantifying resilience
- Indicators of resilience
- Input document

# Increasing interest in term 'resilience'





## Citation network

- **pink** = social sciences;
- **turquoise** = ecology and environmental sciences;
- **orange** = psychology;
- **blue** = engineering;
- **black** = social-ecological systems;
- **yellow** = not defined.

# Different definitions of resilience in different scientific fields

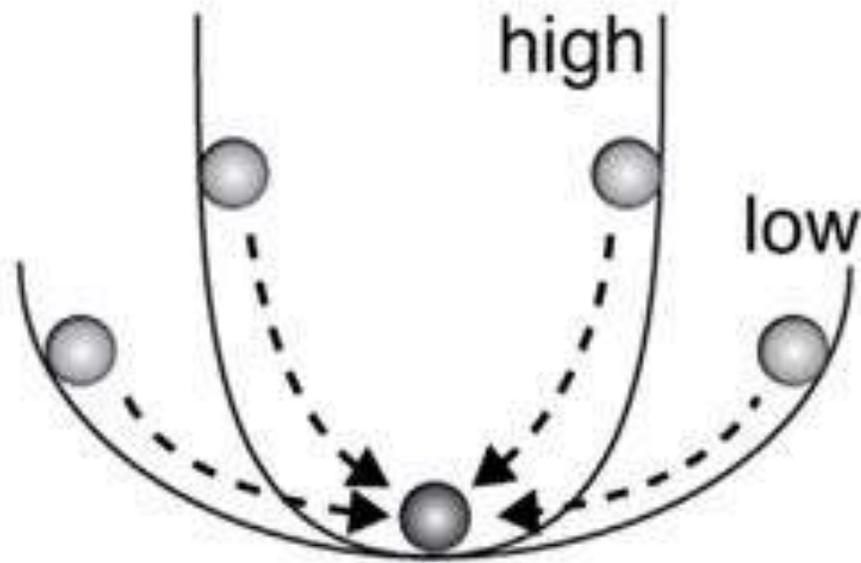
- Psychological resilience
- Physical resilience
- Engineering resilience
- Ecological resilience
- Resilience of social-ecological systems
- Social resilience

All related to:

**The ability of a system to respond to change while maintaining specific functions/attributes/controls**

# Engineering resilience

# Ecological resilience



Recovery rate after a disturbance

Size of disturbance needed to push the system into a different state

Coral reef A

Coral reef B



Bleaching event

Bleaching event

Coral reef A

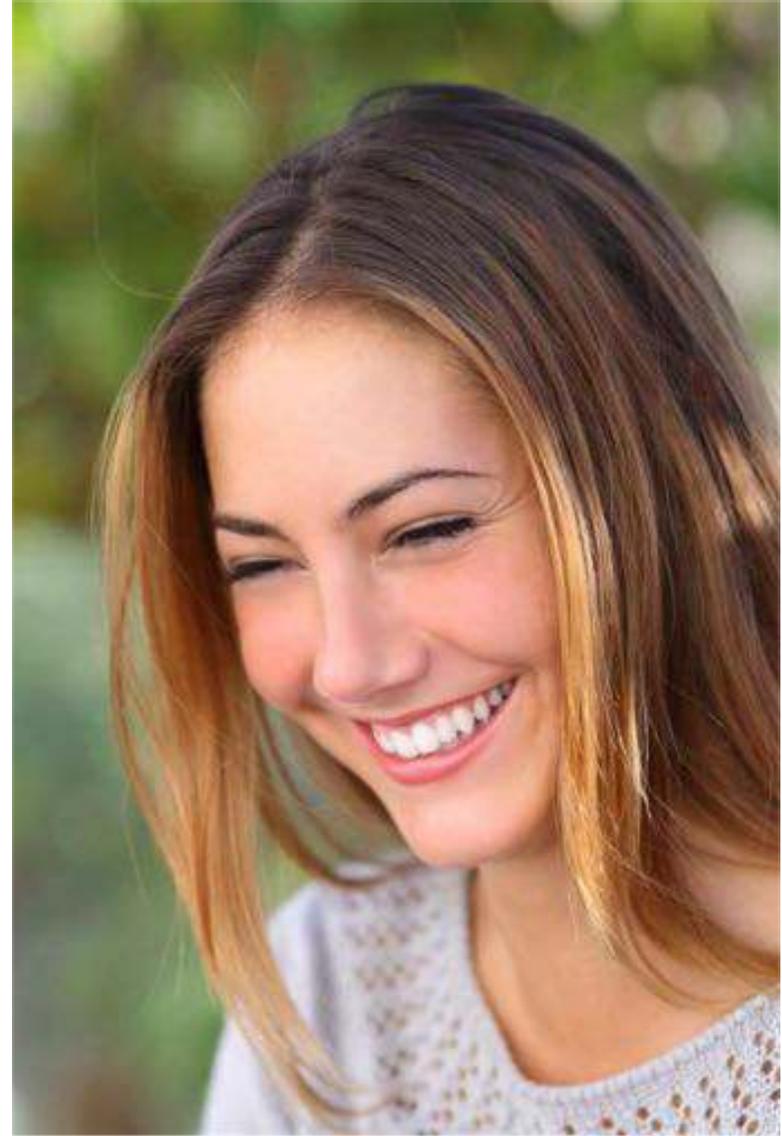


Coral reef B





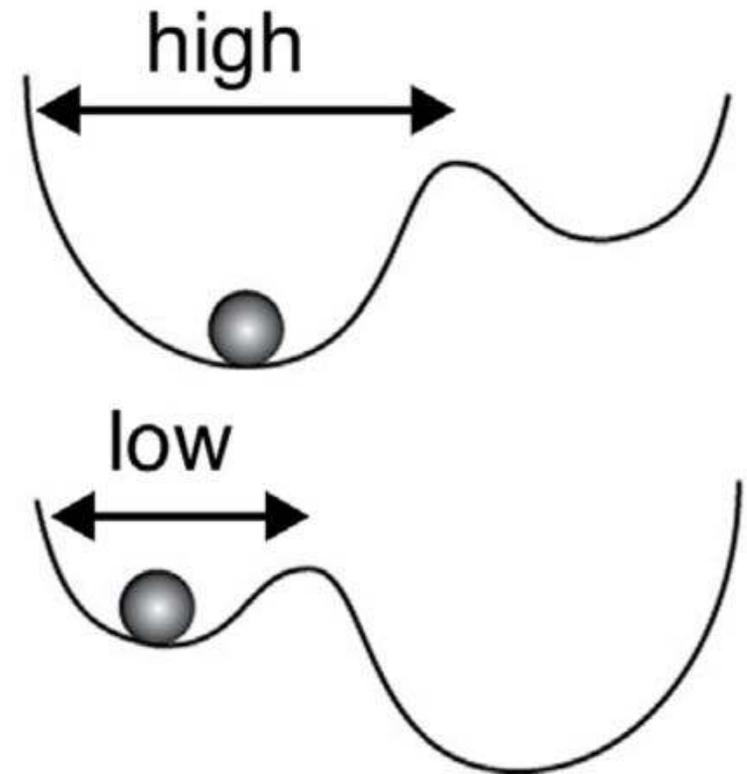
**Bad night sleep**



**Bad night sleep**

# What kind of interactions make an (eco)system resilient?

- Diversity and redundancy
- Stabilizing feedbacks
- No or weak reinforcing feedbacks
- Connectivity ..



Can we measure resilience in real systems?

# Generic indicators of resilience

Vol 461 | 3 September 2009 | doi:10.1038/nature08227

nature

## REVIEWS

### Early-warning signals for critical transitions

Marten Scheffer<sup>1</sup>, Jordi Bascompte<sup>2</sup>, William A. Brock<sup>3</sup>, Victor Brovkin<sup>5</sup>, Stephen R. Carpenter<sup>1</sup>, Vasilis Dakos<sup>1</sup>, Hermann Held<sup>6</sup>, Egbert H. van Nes<sup>1</sup>, Max Rietkerk<sup>7</sup> & George Sugihara<sup>8</sup>

Complex dynamical systems, ranging from ecosystems to financial markets and the climate, can have tipping points at which a sudden shift to a contrasting dynamical regime may occur. Although predicting such critical points before they are reached is extremely difficult, work in different scientific fields is now suggesting the existence of generic early-warning signals that may indicate for a wide class of systems if a critical threshold is approaching.

## Generic Indicators of Ecological Resilience: Inferring the Chance of a Critical Transition

Marten Scheffer,<sup>1</sup> Stephen R. Carpenter,<sup>2</sup> Vasilis Dakos,<sup>3</sup> and Egbert H. van Nes<sup>1</sup>

## REVIEW

CORRECTED 23 NOVEMBER 2012; SEE LATER

### Anticipating Critical Transitions

Marten Scheffer,<sup>1,2\*</sup> Stephen R. Carpenter,<sup>3</sup> Timothy M. Lenton,<sup>4</sup> Jordi Bascompte,<sup>5</sup> William Brock,<sup>6</sup> Vasilis Dakos,<sup>3,4</sup> Johan van de Koppel,<sup>7,8</sup> Ingrid A. van de Leemput,<sup>1</sup> Simon A. Levin,<sup>9</sup> Egbert H. van Nes,<sup>1</sup> Mercedes Pascual,<sup>10,11</sup> John Vandermeer<sup>10</sup>

OPEN ACCESS Freely available online

PLoS one

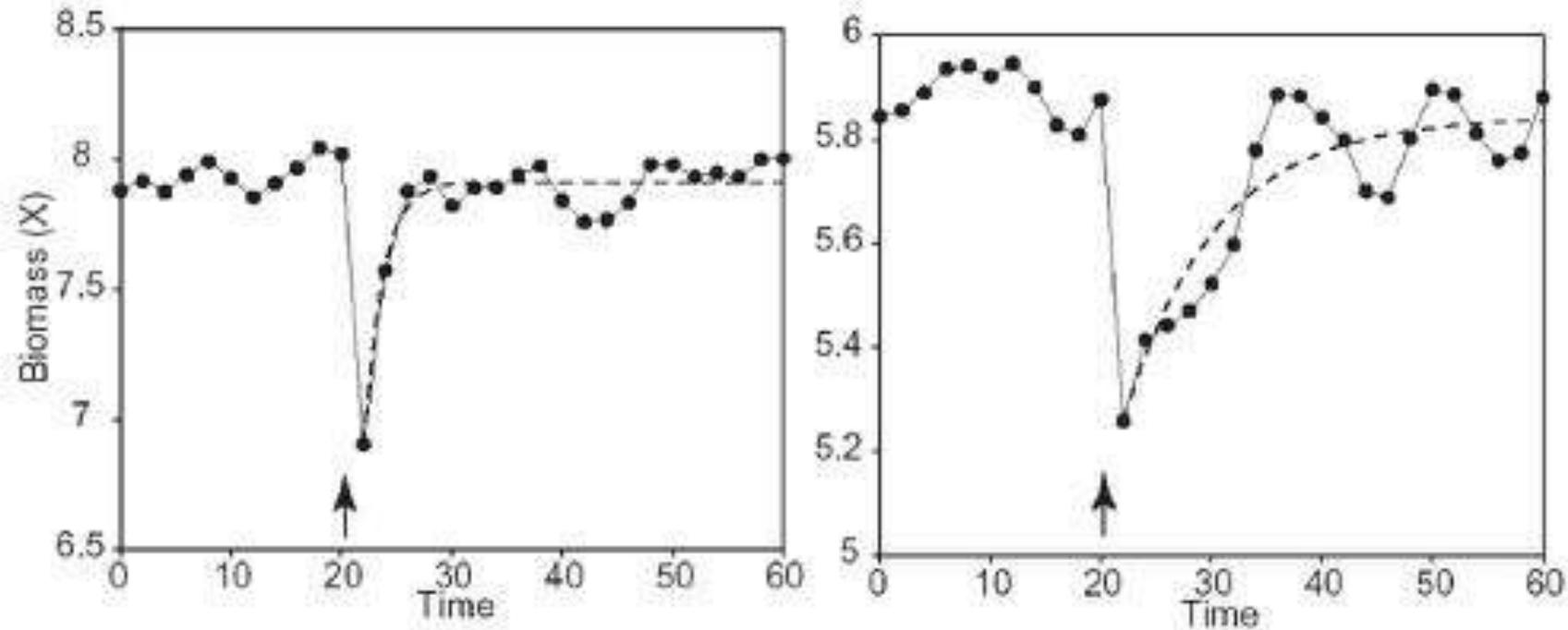
### Methods for Detecting Early Warnings of Critical Transitions in Time Series Illustrated Using Simulated Ecological Data

Vasilis Dakos<sup>1,2\*</sup>, Stephen R. Carpenter<sup>3</sup>, William A. Brock<sup>4</sup>, Aaron M. Ellison<sup>5</sup>, Vishweshha Guttal<sup>6</sup>, Anthony R. Ives<sup>7</sup>, Sonia Kéfi<sup>8</sup>, Valerie Livina<sup>9</sup>, David A. Seekell<sup>10</sup>, Egbert H. van Nes<sup>1</sup>, Marten Scheffer<sup>1</sup>

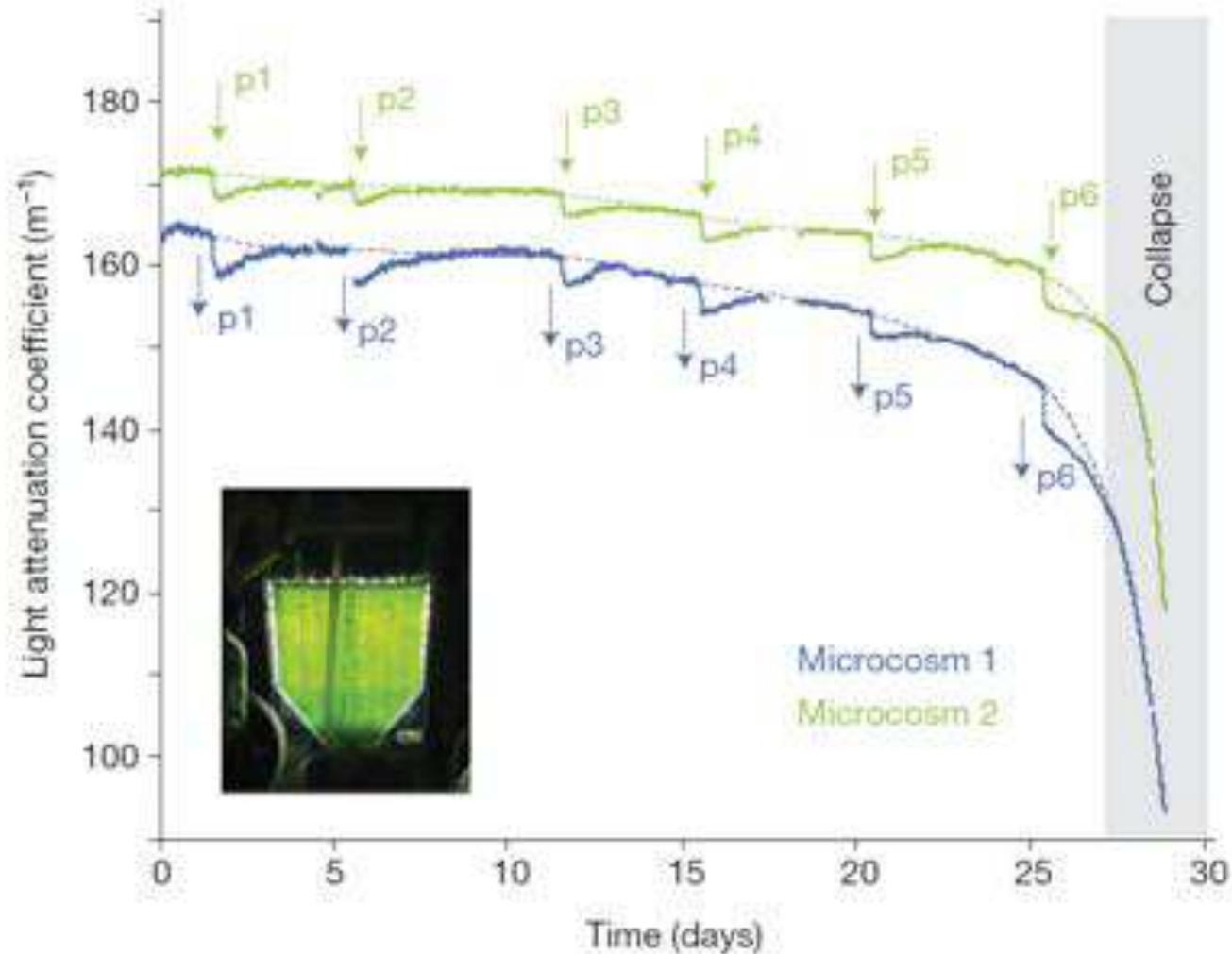


Critical slowing down

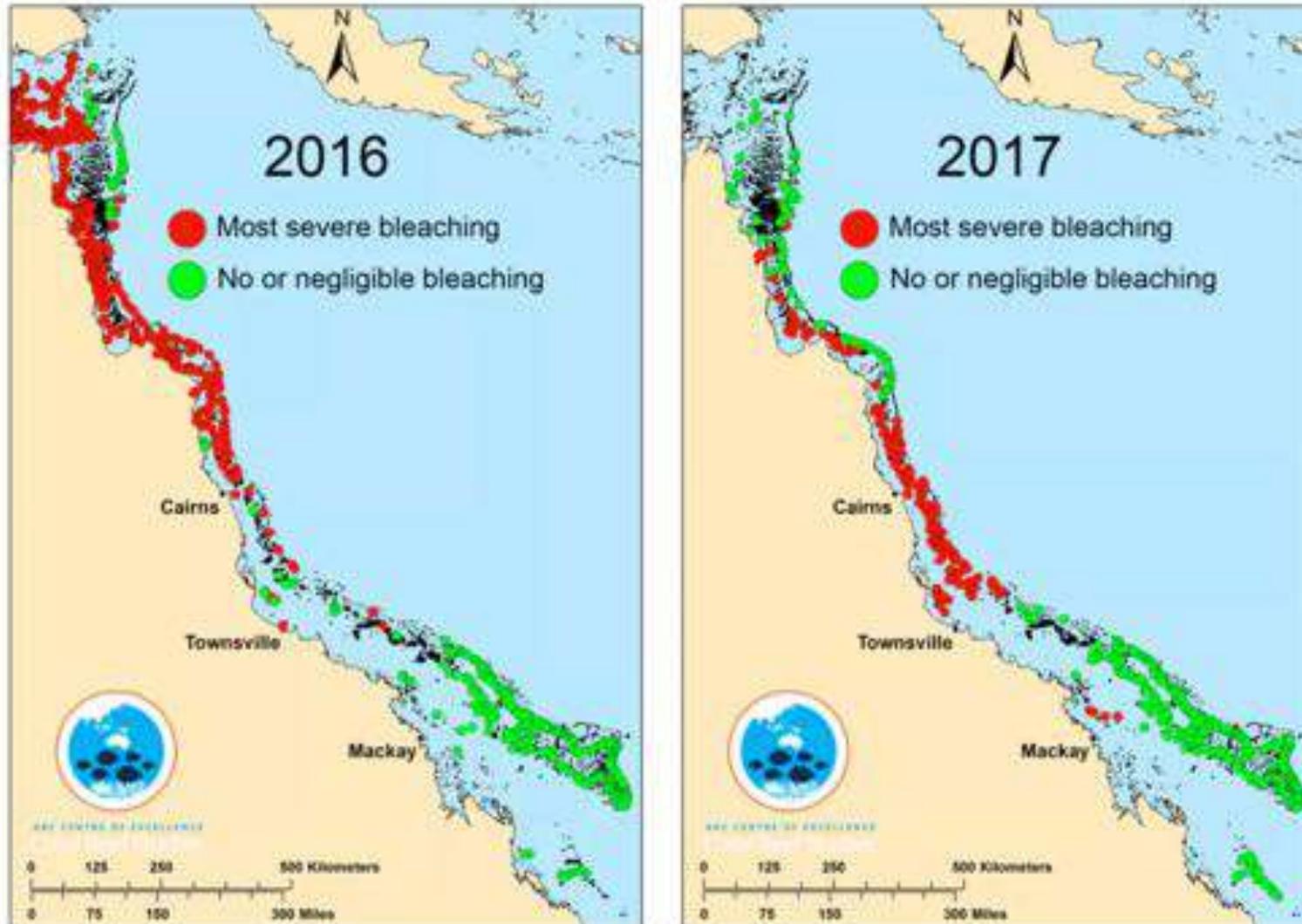
# Recovery rate from perturbations



# Recovery rate as resilience indicator in experiments

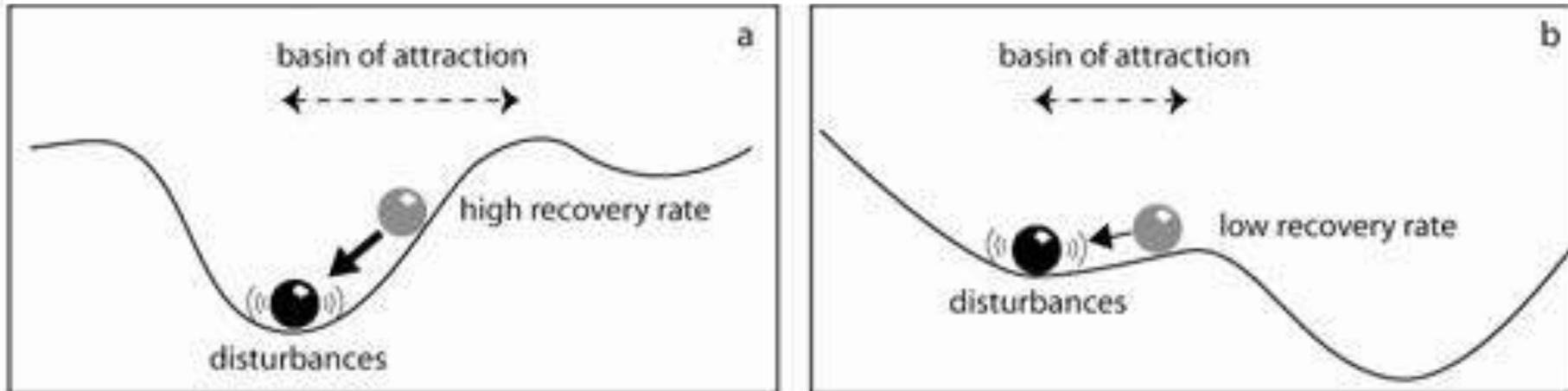


# Recovery rate as resilience indicator



# Indicators of resilience using natural fluctuations

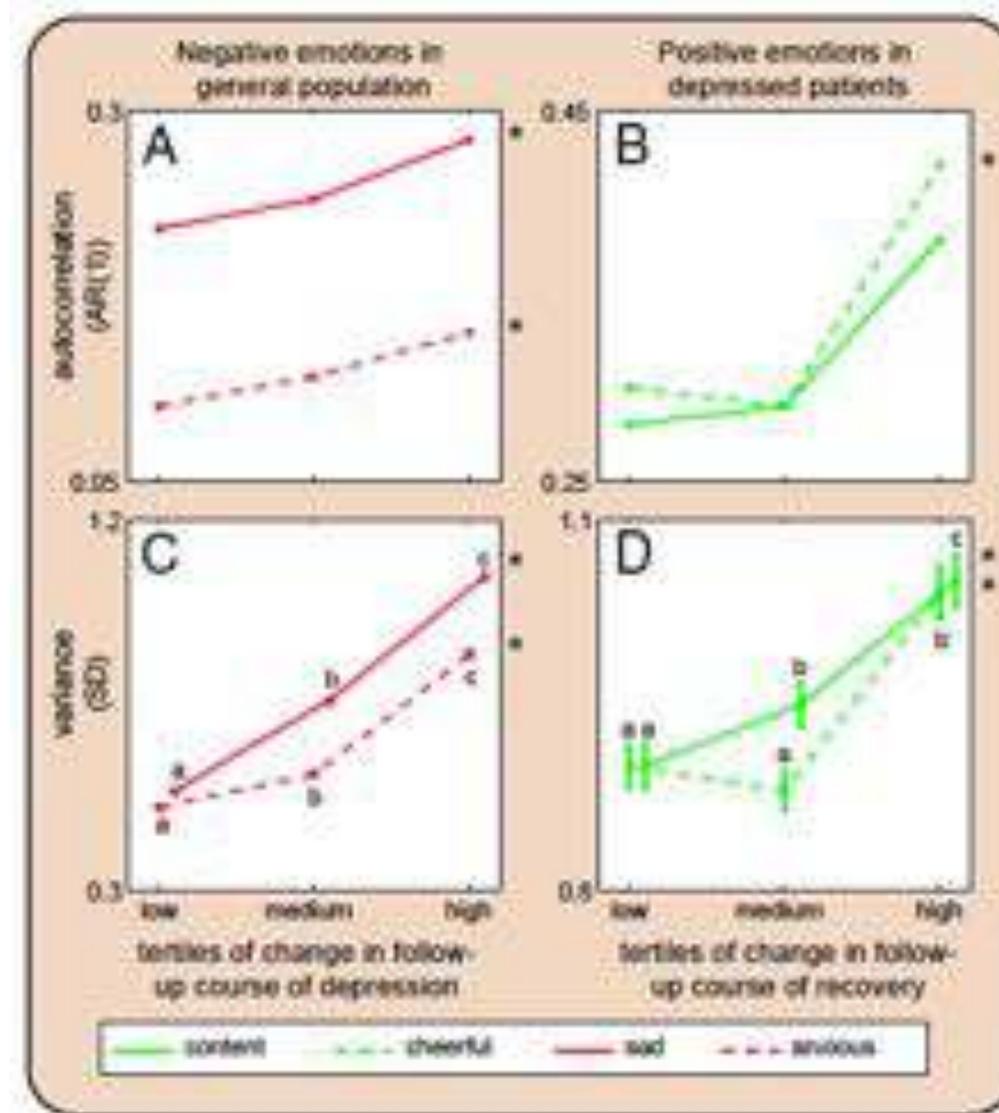
close to 'tipping point'



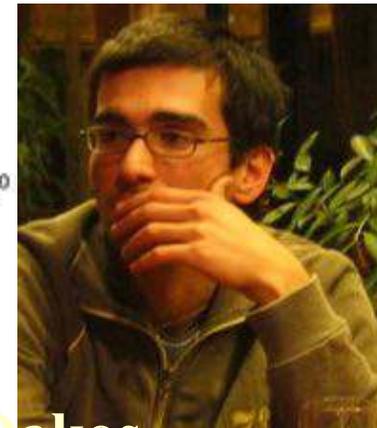
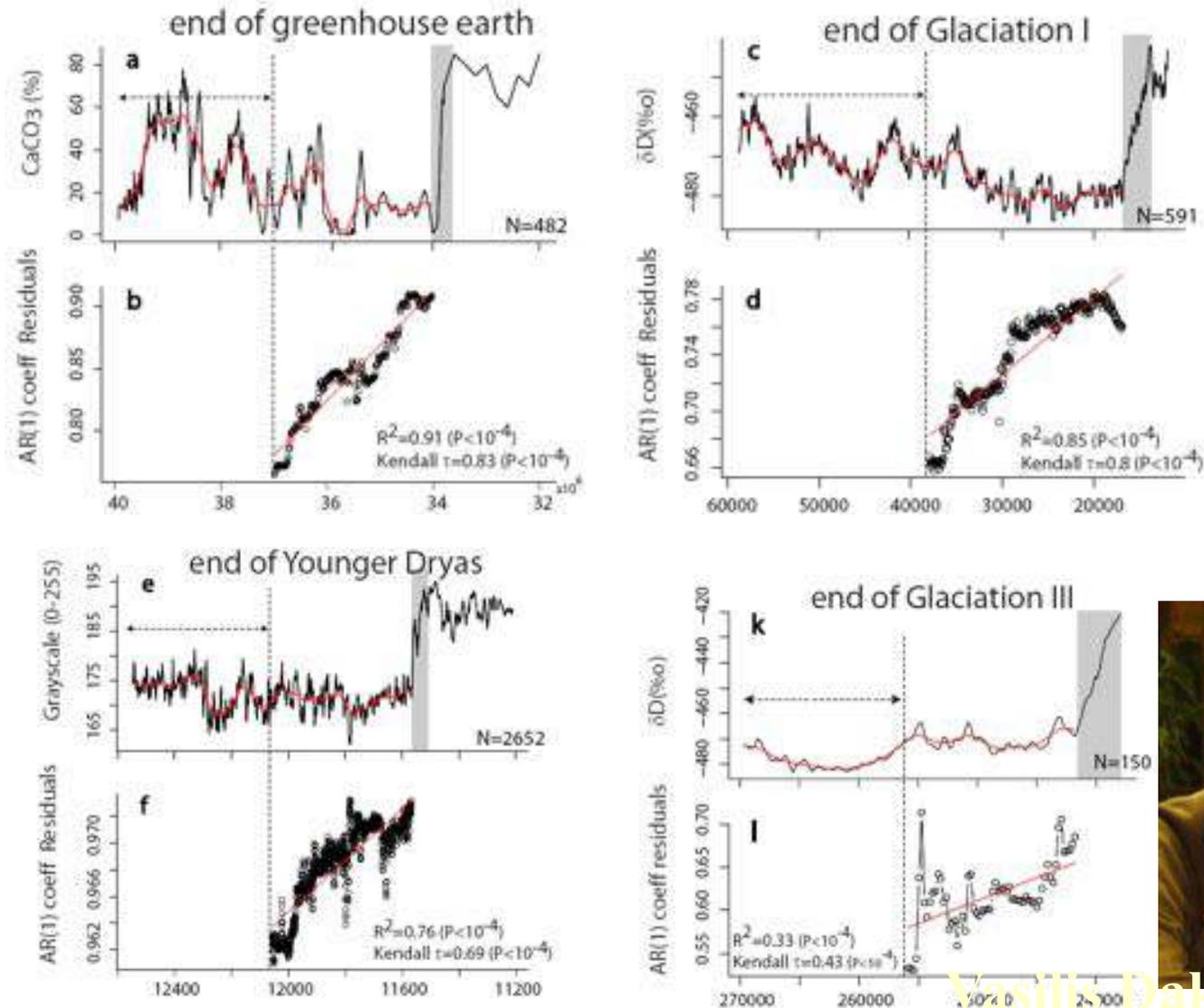
increased  
variance

increased  
autocorrelation

# Indicators of resilience in mental health

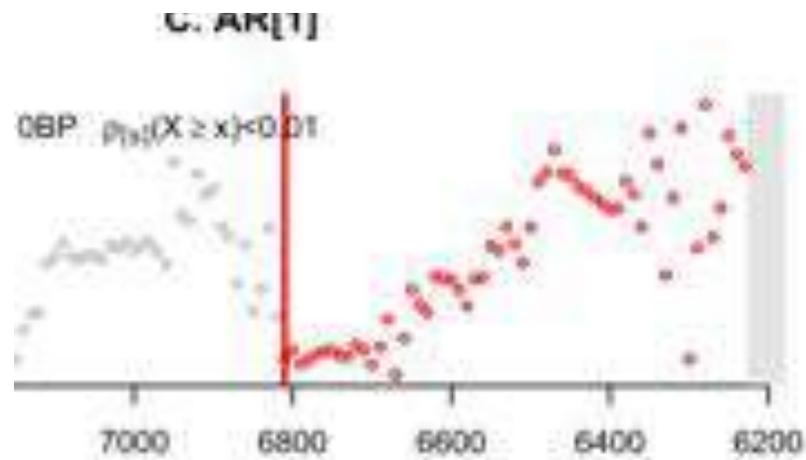
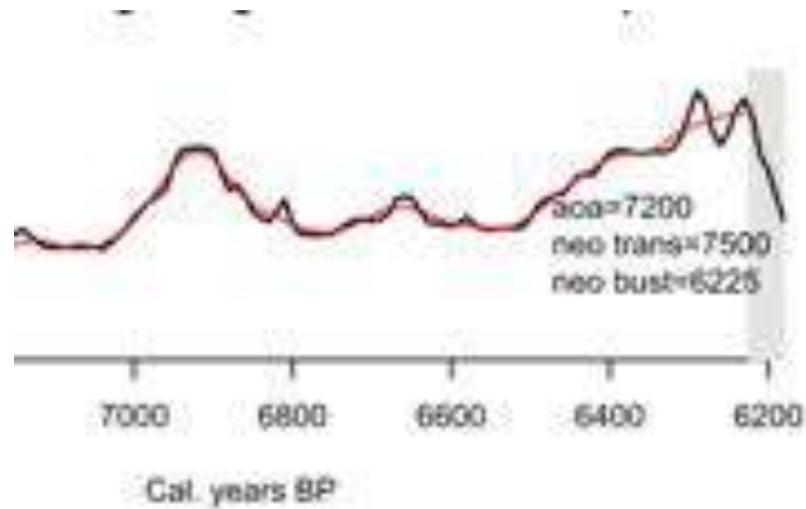


# Indicators of resilience in ancient climate

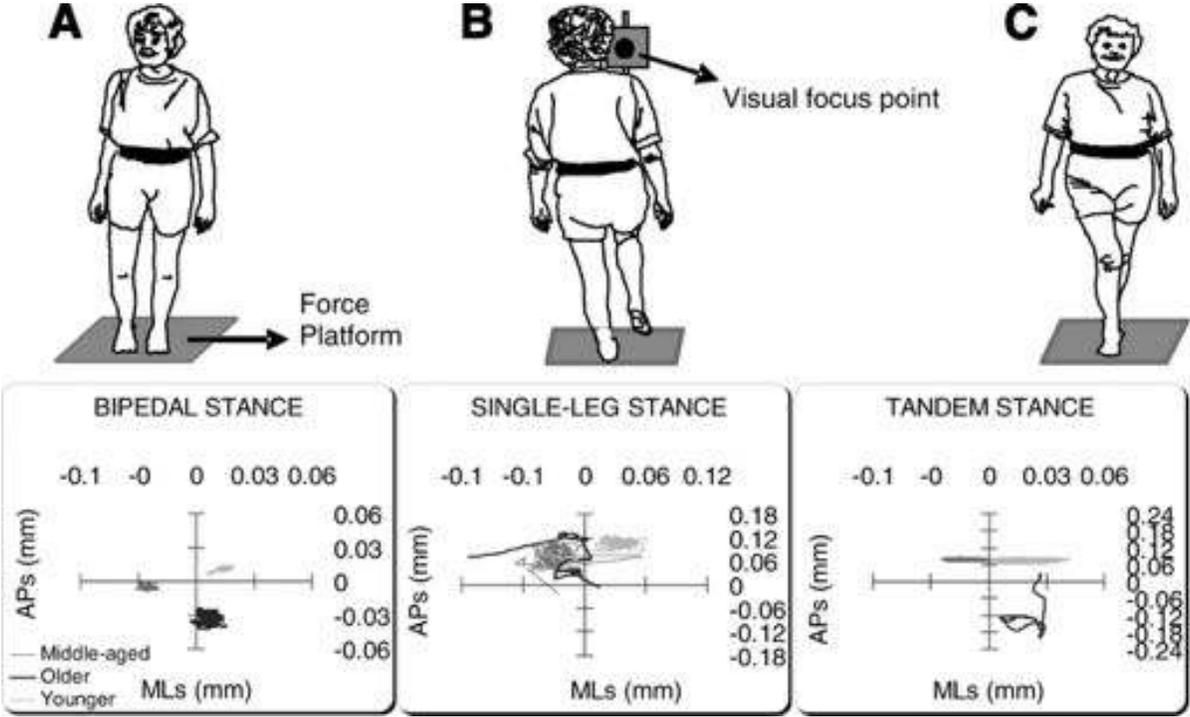


Vasilis Dakos

# Neolithic human population size



# Human body: frailty of elderly



Sanne Gijzel

Onambele et al. 2006 Journal of Applied Physiology 100 6, 2048-2056

Olde Rikkert, et al. 2016. ]Critical Care Medicine 44.

# Input document

- Guided by the existing research, we propose that resilience captures *the capacity of a system to withstand shocks and its ability to recover from them.*
- In particular, we postulate that resilience can only be measured against a certain perturbation. In fact a system may be resilient with respect to one kind of shock, but not against another one.

# Input document

We want to highlight the following shortcomings:

- We lack *a conceptual framework* that would allow us to obtain quantitative measures capturing the *resilience of social organizations* based on the two concepts of robustness and adaptation
- We lack an *understanding of the micro-processes* within social organizations that would allow us to explain why some social organizations are resilient, while others are not.
- The lack of such micro-foundation severely limits our ability to foster resilient system, e.g., by means of implementing suitable incentive mechanisms.



# Limitations generic resilience indicators

- non-stationary conditions: system is not in equilibrium
- rapid approach to the transition
- periodically fluctuating environments
- large observation error
- not enough data
- autocorrelated noise
- large process error: the magnitude of environmental shocks may overshadow slowing down
- spatial processes ignored
- measuring the wrong variable in networks