# Spatial correlation as leading indicator of catastrophic shifts

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#### [transitions]

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#### Can we foresee if a system approaches a transition?



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## Early Warning Signals (EWS) as Indicators of Resilience

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Carpenter & Brock, 2006



Guttal & Jayaprakash, 2008

Model prediction Data Freshwater forcing (Sv) end of Younger Dryas 195 -0.35 -0.3 -0.25 -0.2-0.15-0.05-0.1Grayscale (0-255) 0.010 e (principal component) 4000 - C 185 F2 900.0 Salinity 175 0.002 165 -0.002 N=2652 N=1000 AR(1) coeff Residuals 0.92 AR(1) coeff Residuals d 0.970 0.88 0.962 0.966 0.84  $R^{2}=0$ .76 (P<10<sup>-4</sup>) 0.80 Kendall 7=0.89 (P<10 all τ=0.69 (P<10<sup>-4</sup> Kend 20 10 30 50 12000 0 40 1240 11600 11200 time (x1,000 years) Increasing autocorrelation at-lag-1

Dakos et al., 2008; Held & Kleinen, 2004

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## **Correlation** in **Space** as an Early Warning Signal?

#### Critical slowing down prior to a transition



Van Nes & Scheffer, 2007

#### Slowing down in space?



Patches become more dependent one on another: Start to appear similar not only to themselves but also to their neighbors

#### Three simple spatial explicit bistable models

start of simulation to



•Overharvesting model (May, 1977)

• Eutrophication model (Carpenter et al, 1999)

•Vegetation-turbidity model (Scheffer, 1998)

Estimate and compare spatial and temporal correlation indicators:

- temporal autocorrelation at-lag-1
- spatial correlation of neighbors

#### Spatial and Temporal correlations vs. Connectivity



low connectivity

#### Spatial or Temporal correlation as indicator?



- Spatial correlation between neighbors increases prior to a transition due to "slowing down" in space.
  Slowing down makes neighboring patches to become more similar to their neighbors through diffusion.
- Spatial correlation can qualify as early warning signal for system transitions and may be used as an indicator of resilience.
- However it is a relative measure and should be treated as system specific.

#### Take home message #2

•Estimating ecosystem resilience: Spatial or Temporal correlation?

depends on strength of diffusion and heterogeneity among patches



**Designing Monitoring Schemes:** 

- Spatial correlation uses snapshots (aerial photos)
- Temporal correlation requires continuous monitoring (costly and difficult)



### Thank you for your attention!

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# WHAT WILL YOU DO?

WHELE WWW.THEDAWAFTERTOINGRAPOW.DOM

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