# The time scale of resilience-based forecasts and their potential use

ESA Annual Meeting, August 10, 2018, New Orleans, LA

#### Ryan Batt, Tarsha Eason and Ahjond Garmestani

*The National Academies of Academies of MEDICINE* 



#### Acknowledgements

Steve Carpenter (UW–Madison) Mike Pace (UVA) Jon Cole (Cary Institute)

# RUTGERS

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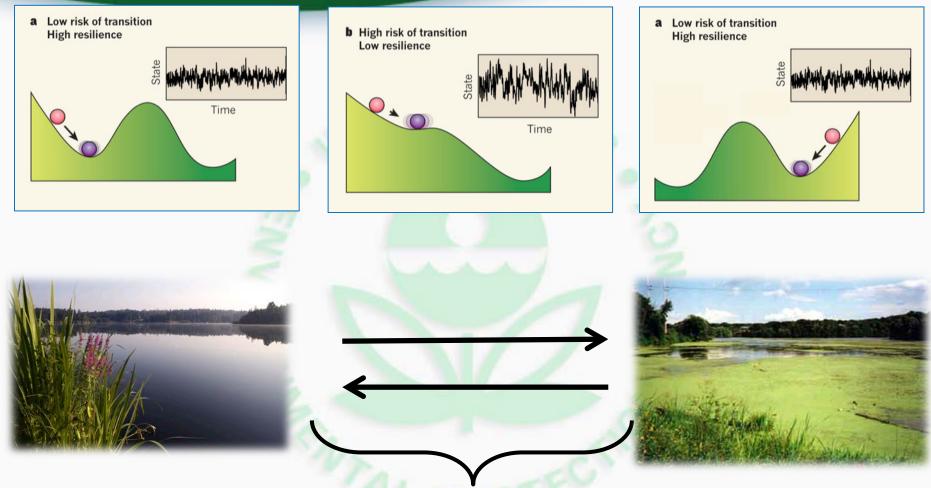






#### **Operationalizing resilience-based forecasts**

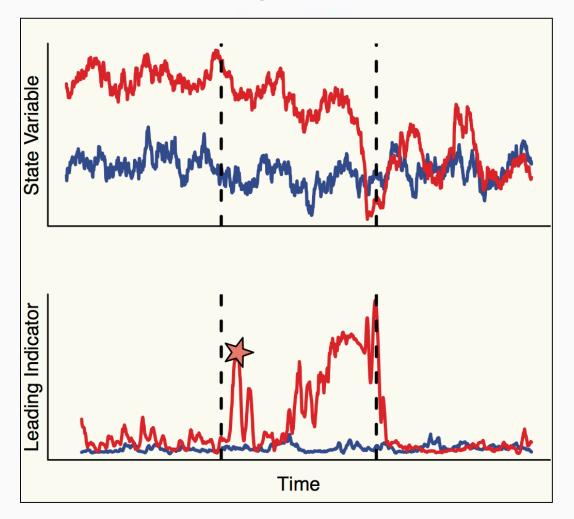
- Resilience-based forecast primer
- Time scale of an early warning
- How do we hope to use these warnings?



- Low resilience period
- Warnings in autocorrelation, variance

Scheffer et al. 2009 Nature

#### Statistical warning before state change





The shores of Rodrigo de Freitas Lake in Brazil are littered with fish killed by algal overgrowth in March 2000.

# From patterns to predictions

Truly generic signals warning of tipping points are unlikely to exist, warn **Carl Boettiger** and **Alan Hastings**, so researchers should study transitions specific to real systems.

# Operationalizing resilience-based forecasts

- Resilience-based forecast primer
- Time scale of an early warning
- How do we hope to use these warnings?

# Peter (Manipulated)

Paul (Reference)











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#### CASCADE (rome)

# People Publications Data Methods Black Box Data and Statistics Black Box Data and Statistics 2014 Lakos: Peter, Paul, Tuesday Last Updated: October 27, 2014 (@ 04.49 PM From: May 16, 2014 (day 16b, Te: September 07, 2014 (day 250) Window Size = 28 days Detrend = TRUE Time Series Data

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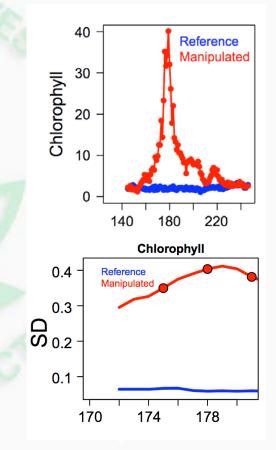
algae

#### Early Warnings of an Algal Bloom





#### Paul (Reference) Peter (Manipulated)



Pace et al. 2017 PNAS Wilkinson et al. 2018 Ecological Monographs

### Are signals present across time scales?

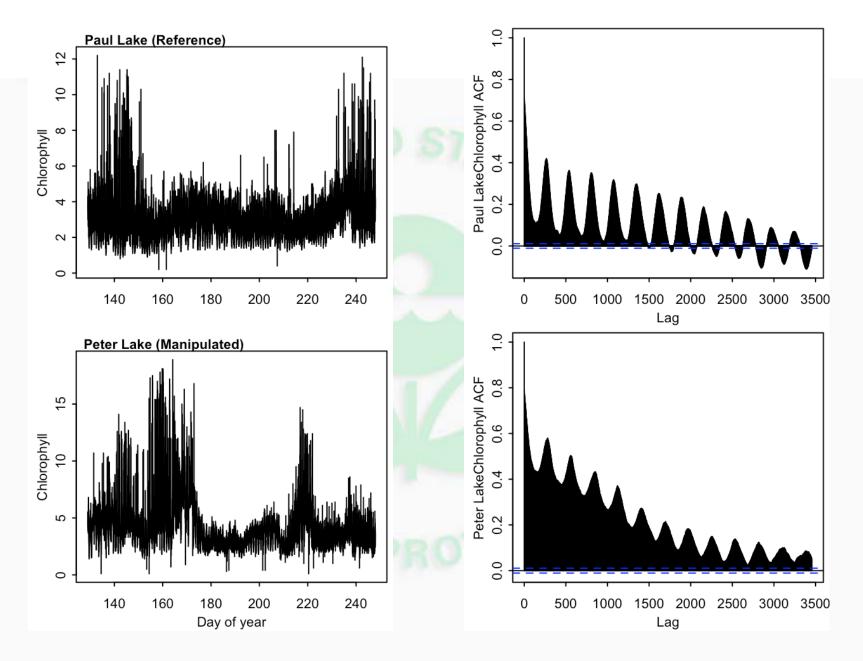
- Lag-1 autocorrelation
  - Seconds or centuries?



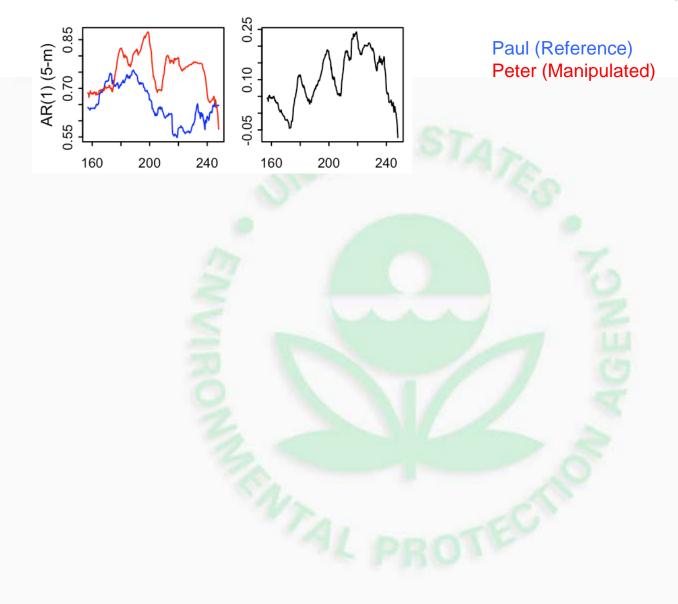




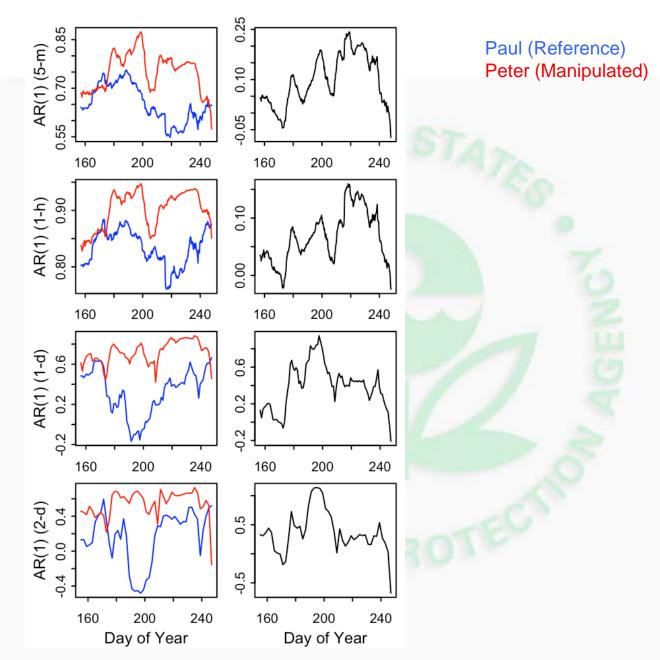
#### Time scales: autocorrelation



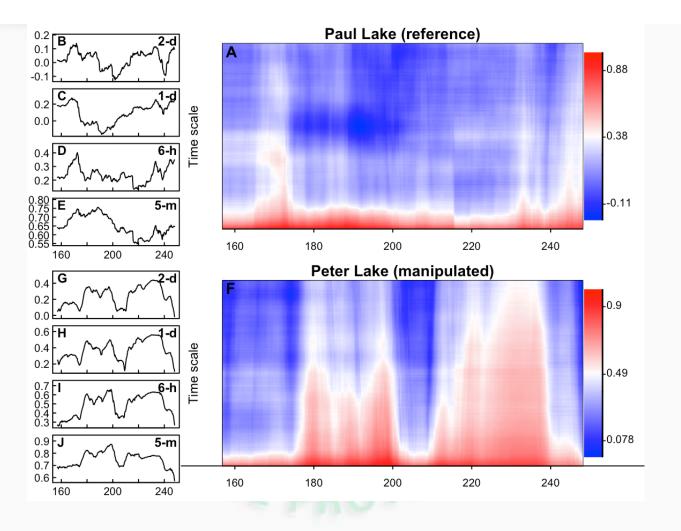
## Time scales: autocorrelation dynamics



## Time scales: autocorrelation dynamics



## Time scales: autocorrelation dynamics



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# Time scale of warnings & use cases

#### Current (react)



- Warning time scale = short
- Long-term solution well-known
- How will forecasts be used?

#### Short Term (react)



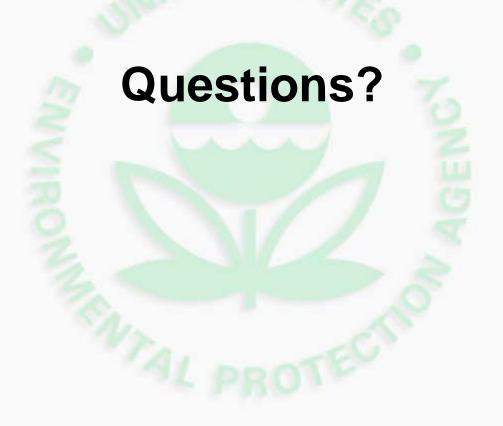
#### Long Term (prevent)



### Disclaimer

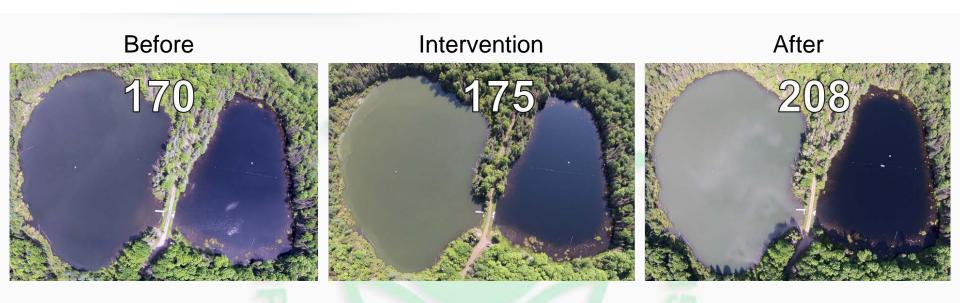
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## Early Warnings Present, but Need Work



#### <u>Successes</u>

- Created Bloom
- Found Warnings
- Reversed Bloom

#### Challenges

- Field & Analytical Choices
- Interpreting Conflicting Signals
- Quantifying Confidence