



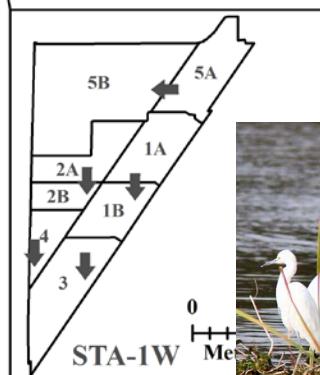
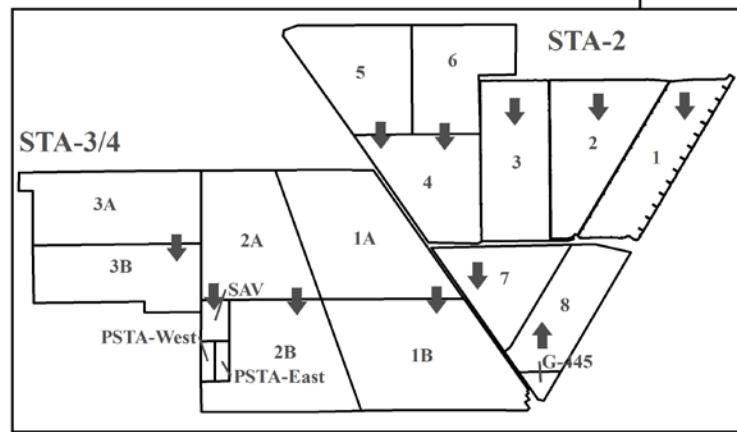
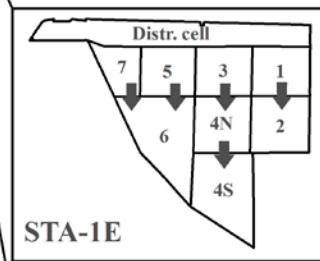
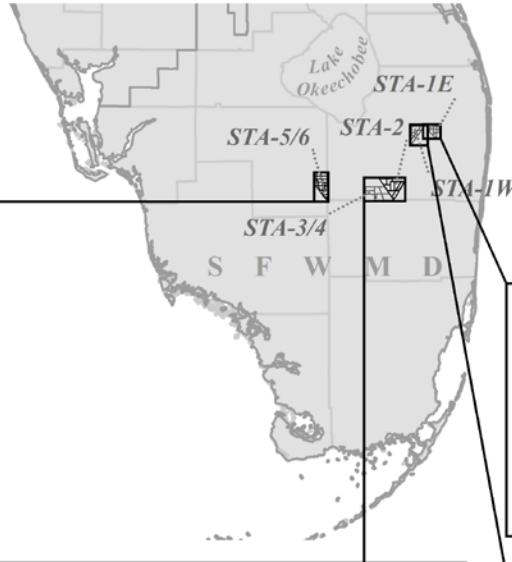
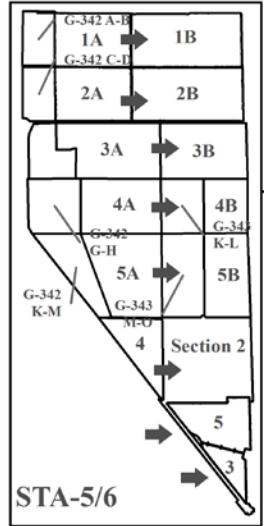
Multivariate Analysis of a non-stationary process. Mapping out system resilience.

Ron Corstanje, Joanna Zawadzka, Delia Ivanoff, and Kathleen Pietro

09 Apr 2018

www.cranfield.ac.uk

The Everglades Storm Water Treatment Areas: a found ecological experiment in resilience



What do we mean with Resilience?

- **Ecological resilience (Holling, 1973)**

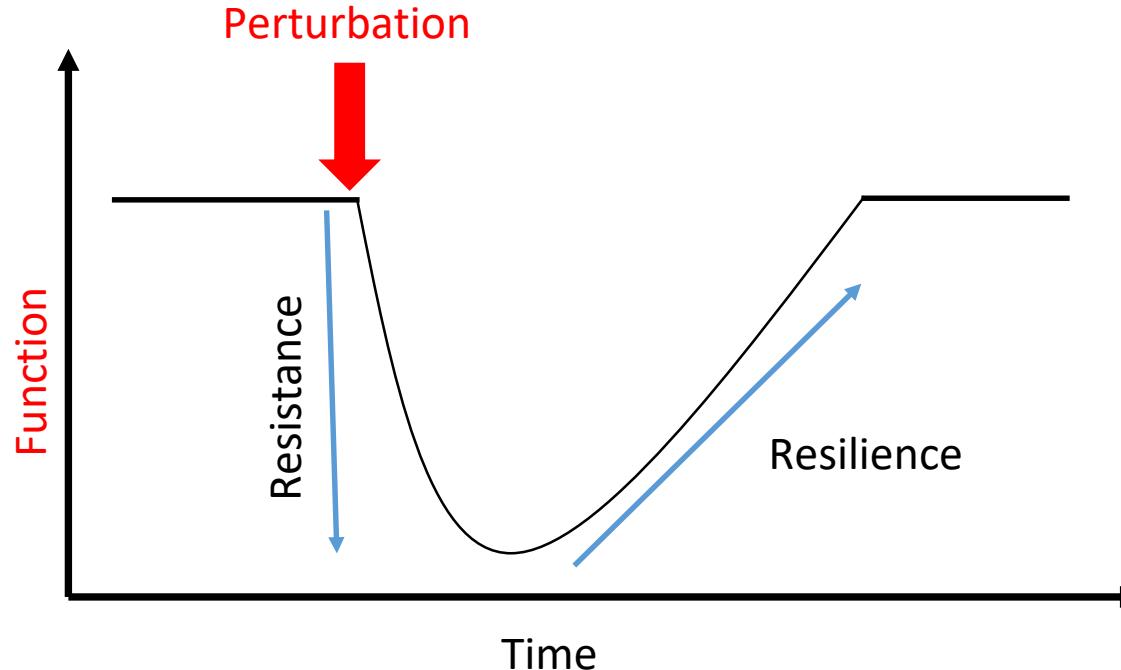
Capacity of an ecosystem to tolerate disturbance without switching to a qualitatively different state that is controlled by a different set of processes:
allows for evolution, adaptation and different species assemblages



- **Engineering resilience (Pimm, 1984)**

Time taken to return to the pre-disturbance state, ***including original characteristics (major headache in restoration, esp. with climate change)***

What do we mean with Resilience?

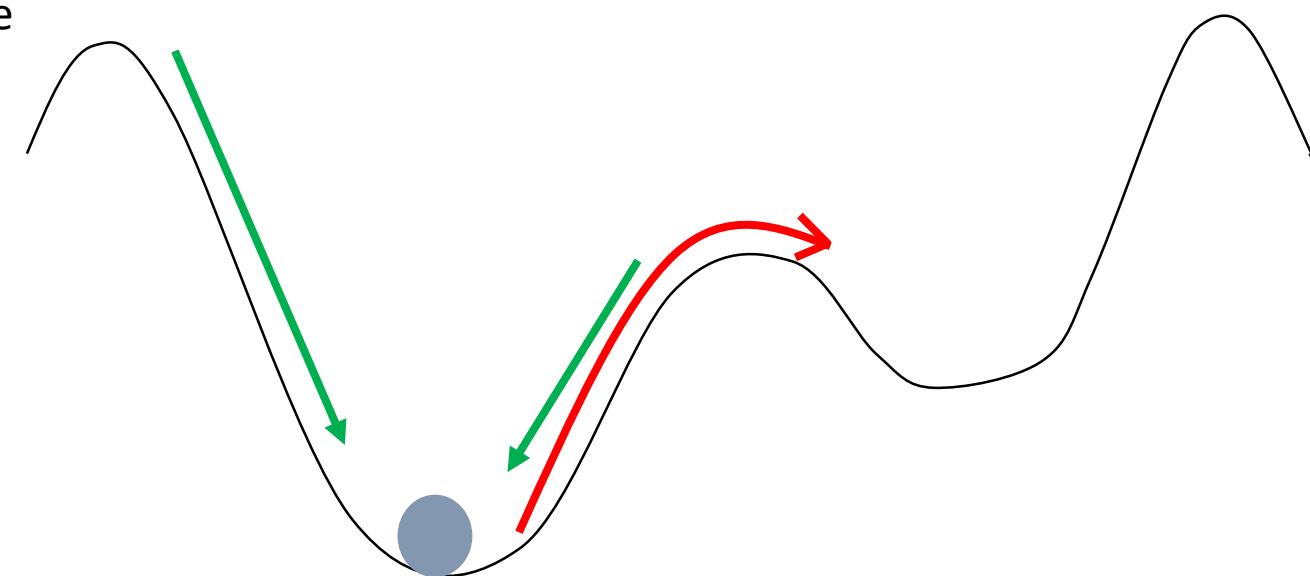


Ecological resilience

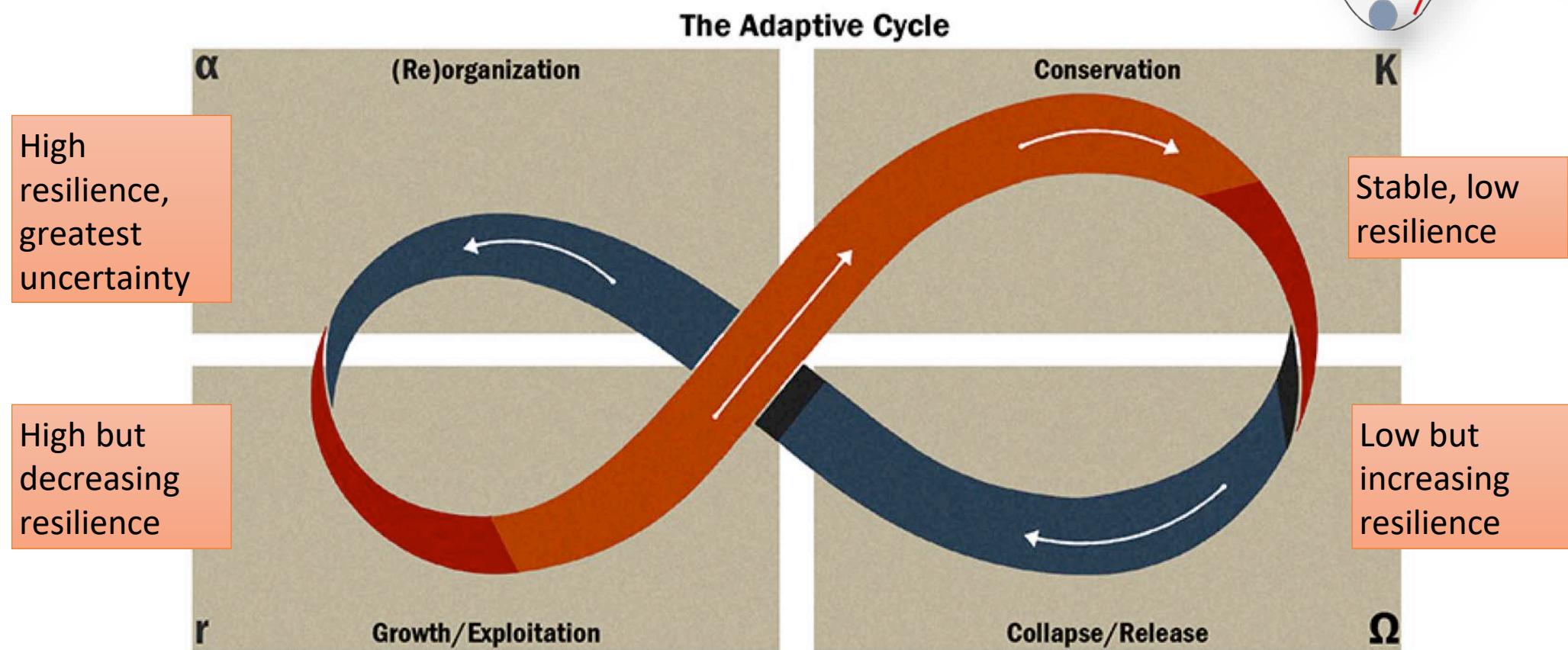
The magnitude of disturbance that can be tolerated before the system changes its state (*Pimm 1984 Nature*)

Engineering resilience

The ability of a system to recover back towards the state it was in prior to disturbance
(*Holling 1973. Ann Rev Eco Syst*)

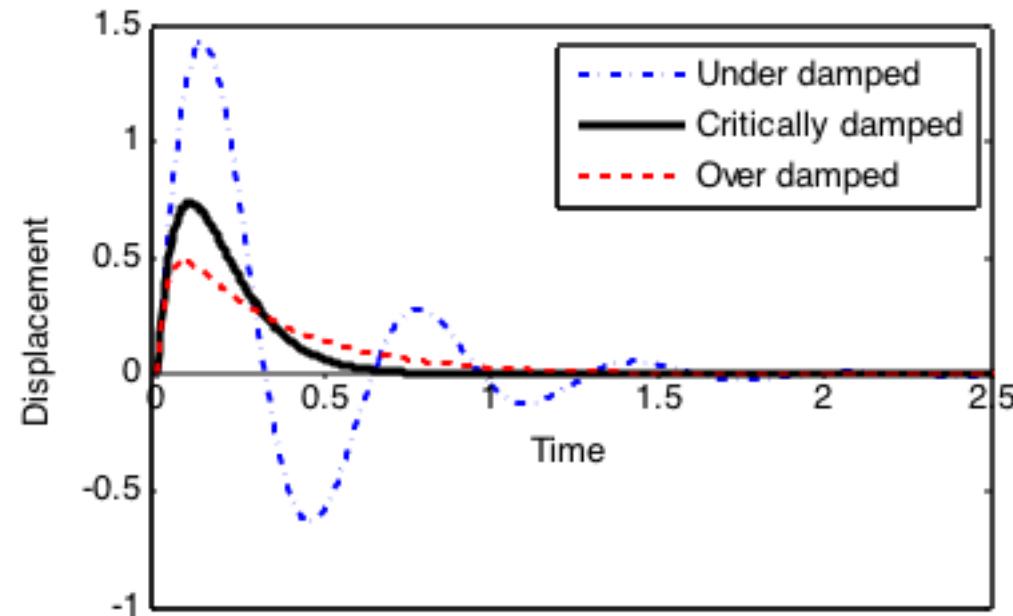
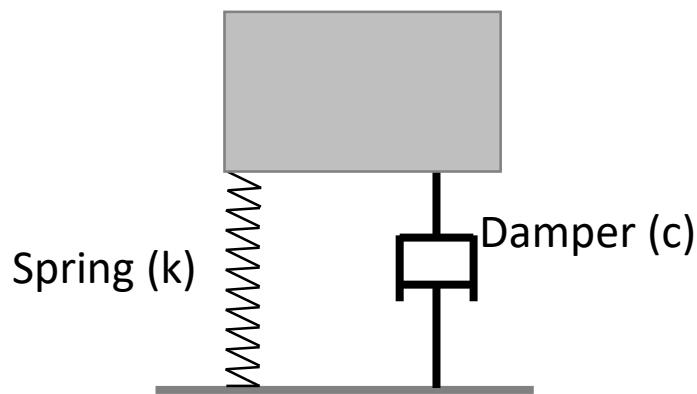


The adaptive cycle



Damped harmonic motion analogy

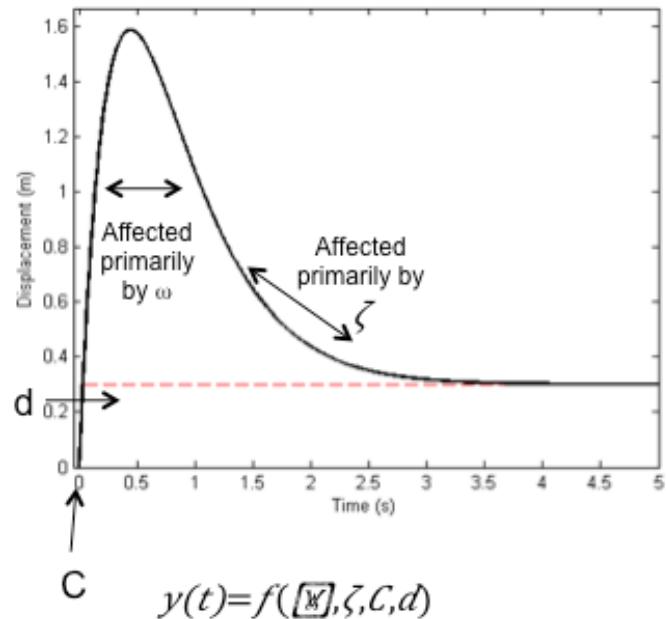
A mass on a spring is disturbed from its equilibrium position



A friction or damping force slowly restores the system to its equilibrium position.

Damping factor: $\zeta = \frac{c}{2\sqrt{km}}$, critically damped when $\zeta = 1$

Damped harmonic motion analogy



$$y(t)=f(\underline{\omega},\zeta,C,d)$$

ζ is the damping factor
 ω is the natural frequency
 C is the initial slope
 d is the final equilibrium

SCIENTIFIC REPORTS

OPEN

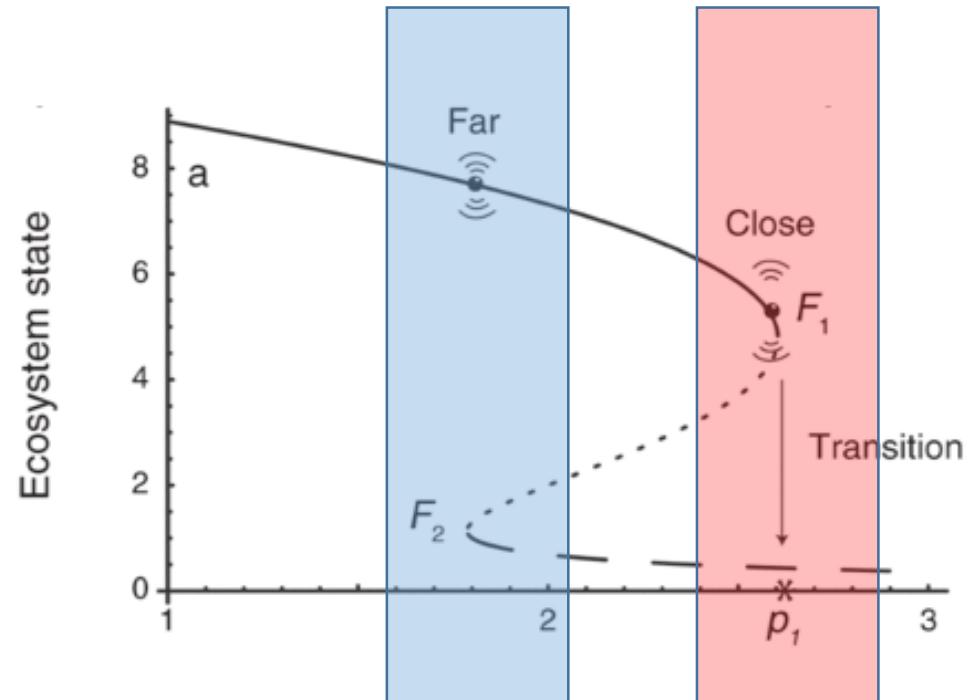
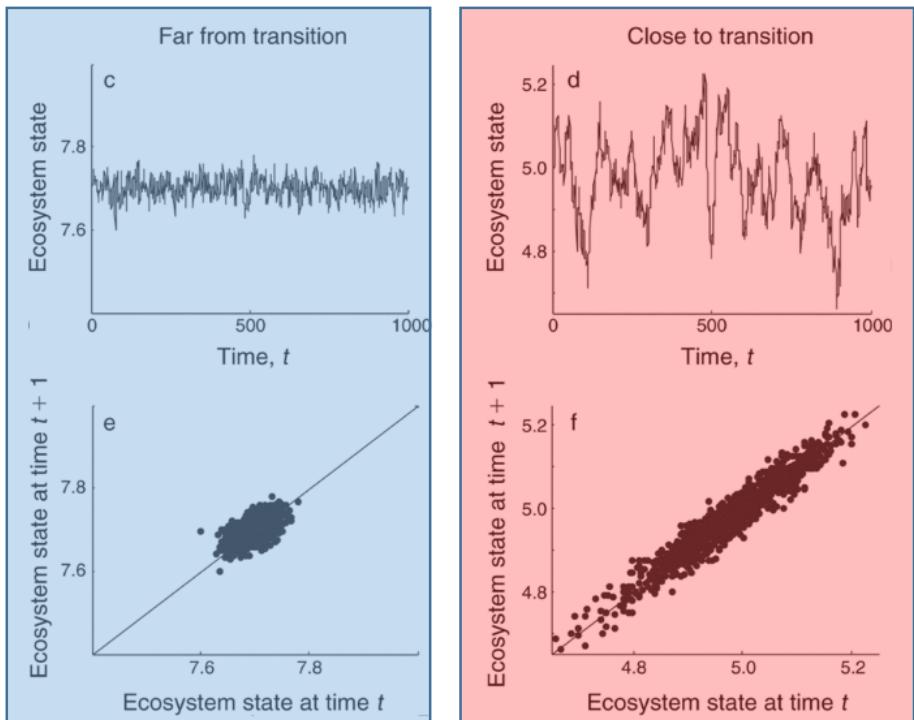
Defining and quantifying the resilience of responses to disturbance: a conceptual and modelling approach from soil science

Received: 07 January 2016
Accepted: 02 June 2016
Published: 22 June 2016

L. C. Todman¹, F. C. Fraser², R. Corstanje², L. K. Deeks², J. A. Harris², M. Pawlett², K. Ritz^{2,3} & A. P. Whitmore¹

Characteristic ¹	Symbol ²	A more resilient soil response...	Units ³
(i) Degree of return	R_r	Returns to a stable level of function closer to a reference level (e.g. the initial level of function or level of a control sample)	U
(ii) Return time-The time taken to reach the new stable level of function	R_t	Reaches the stable level of function more quickly	T
(iii) Rate of return-The rate at which the response tends towards the stable level of function (i.e. related to the gradient of the return period)	R_x	Has a steeper gradient during return	UT^{-1}
(iv) Efficiency	R_e	Has a smaller area under the response curve i.e. is away from the reference level for less time in total	UT

Putting this into practice

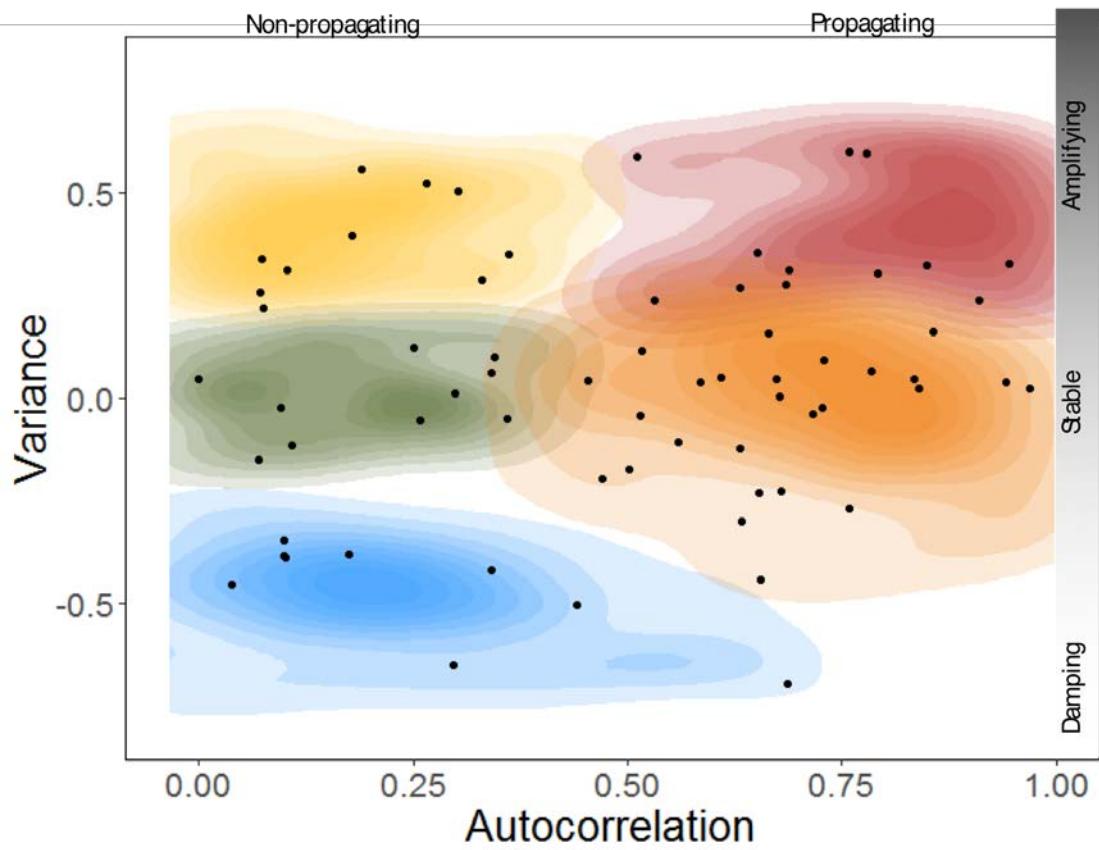


Ecology, 93(2), 2012, pp. 264–271
© 2012 by the Ecological Society of America

Robustness of variance and autocorrelation as indicators
of critical slowing down

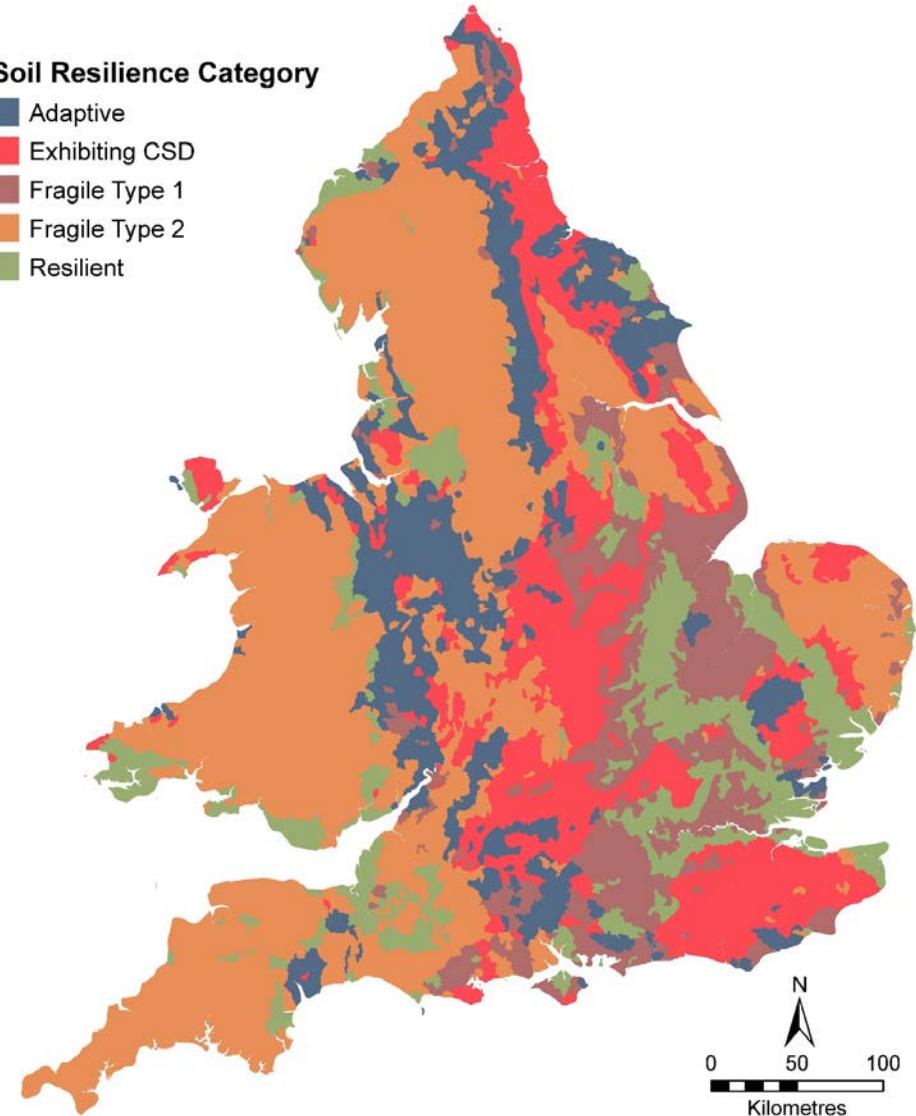
VASILIS DAKOS,^{1,3} EGBERT H. VAN NES,¹ PAOLO D'ODORICO,² AND MARTEN SCHEFFER¹

Operationalising Resilience

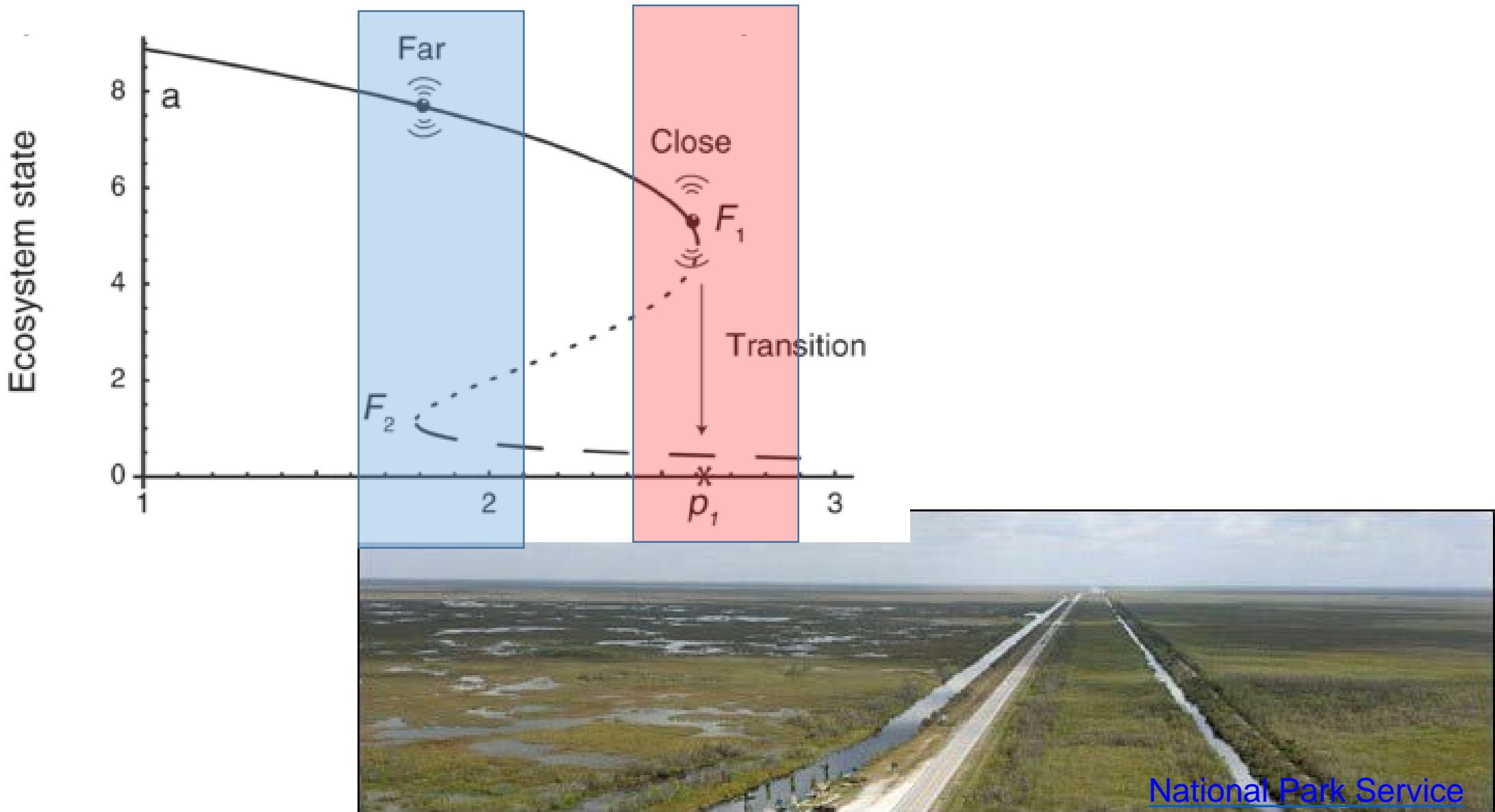


Soil Resilience Category

- Adaptive
- Exhibiting CSD
- Fragile Type 1
- Fragile Type 2
- Resilient



So where are the STA's in this?



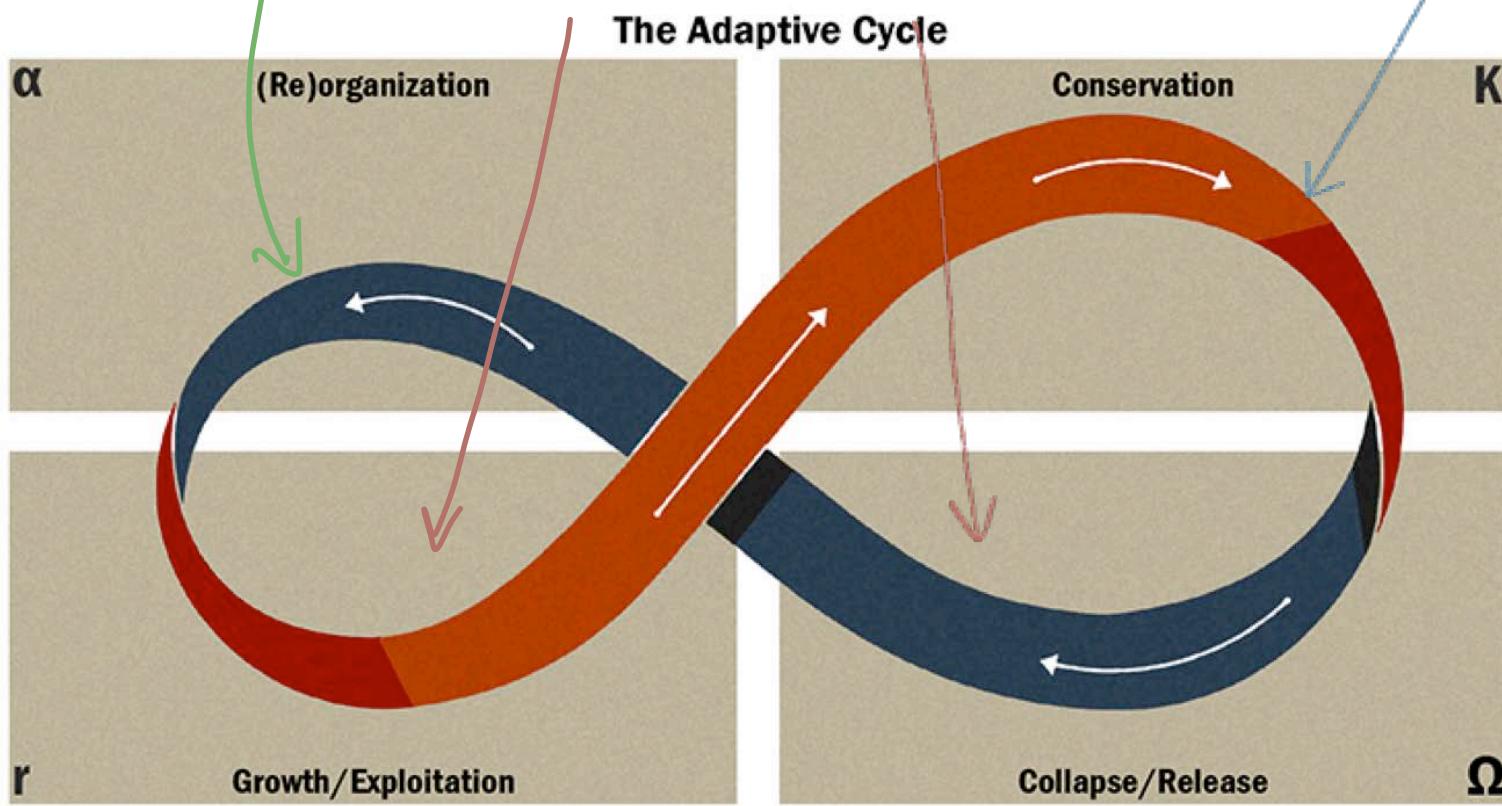


The Everglades Storm Water Treatment Areas: a found ecological experiment in resilience

- The general purpose and function of the STAs is to reduce phosphorus (P) in runoff water prior to discharging to the Everglades Protection Area.
 - The controls on the P removal process are therefore set by the internal biogeochemical, ecological and physical processes and conditions in each cell.
 - They are intrinsically engineered systems, in which the ecosystem is manipulated to obtain a desired outcome (retaining P, removing it from the water column).
 - The systems are stochastic, with frequent changes in ecological structure (emergent marsh to open water systems). The systems are also subject to frequent disturbance events (e.g. hurricanes).
- .
- If we consider a naïve, but exhaustive dataset over these systems then there may be three board expectations represented in the data:*
- 1) The systems broadly function as engineered systems,
 - 2) The systems are self organizing ecological systems,
 - 3) The systems are entirely stochastic

So how does this relate to resilience?

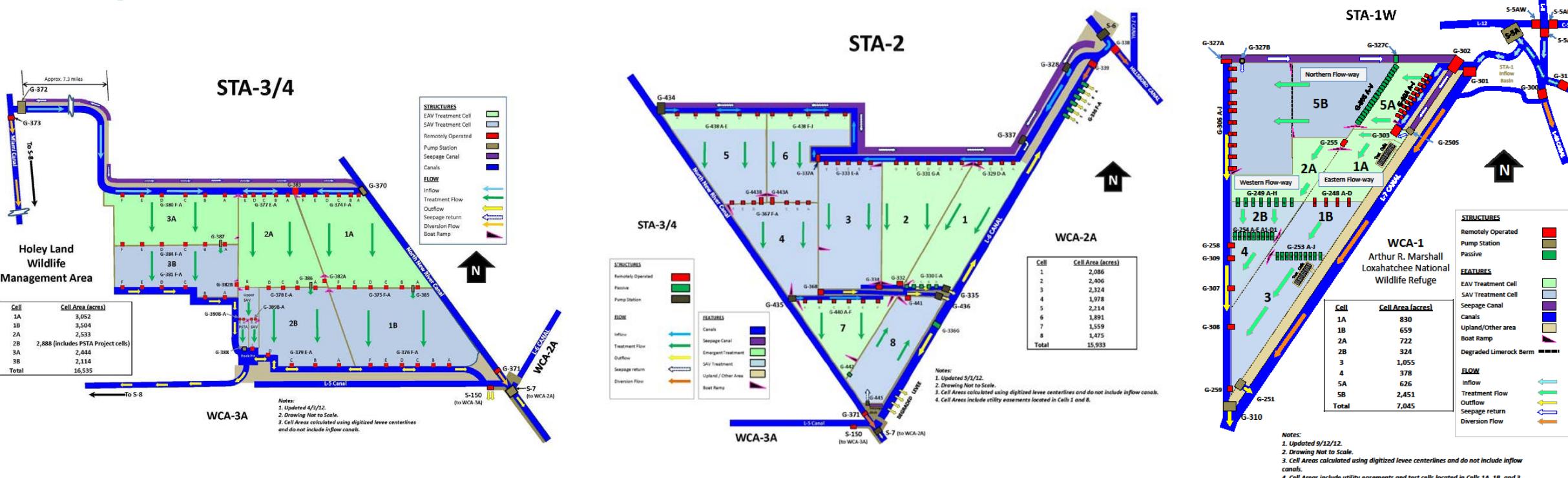
- 1) The systems broadly function as engineered systems,
- 2) The systems are self organizing ecological systems,
- 3) The systems are entirely stochastic



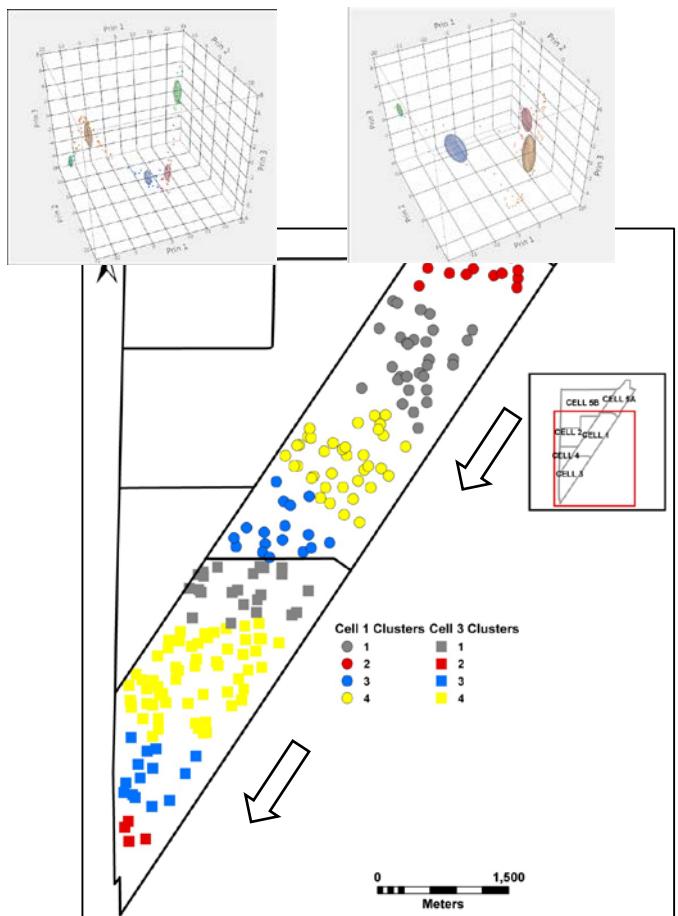
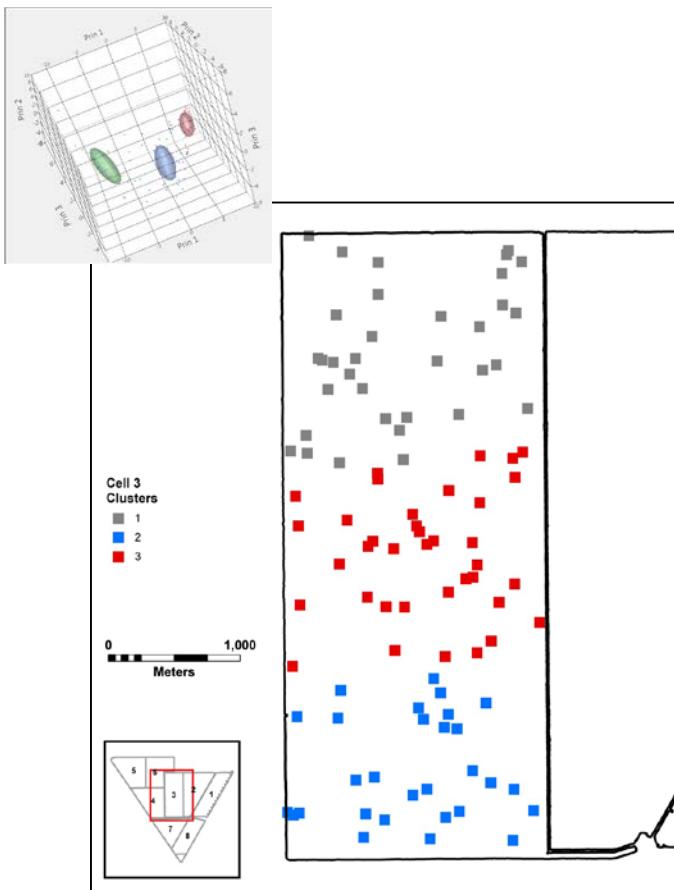
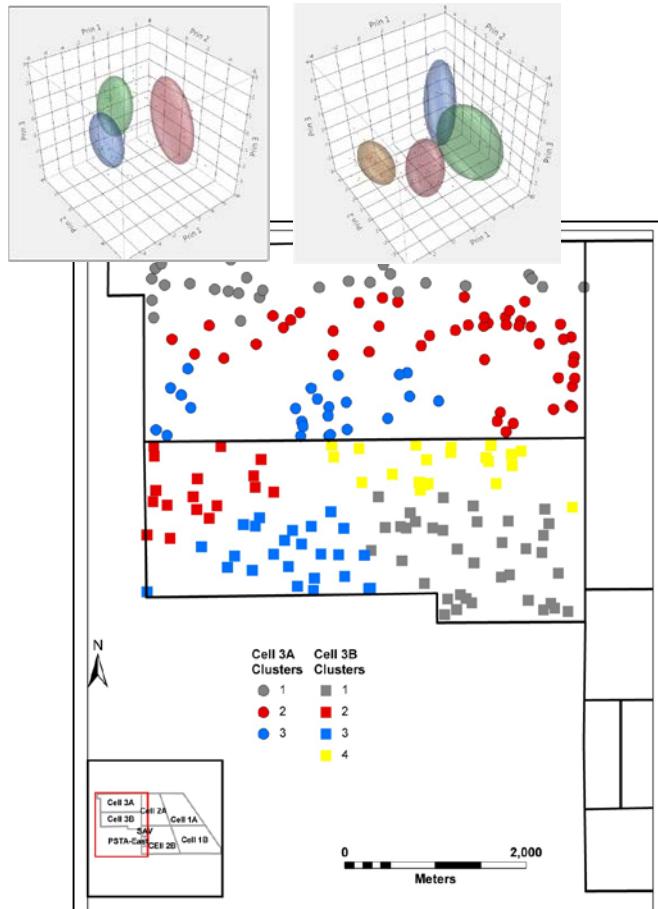
source: Holling, Gunderson and Lüthwig, In Quest of a Theory of Adaptive Change, 2002

Exemplars of the outcome from the datamining exercise

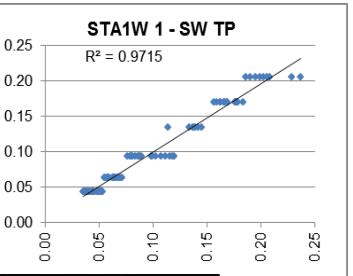
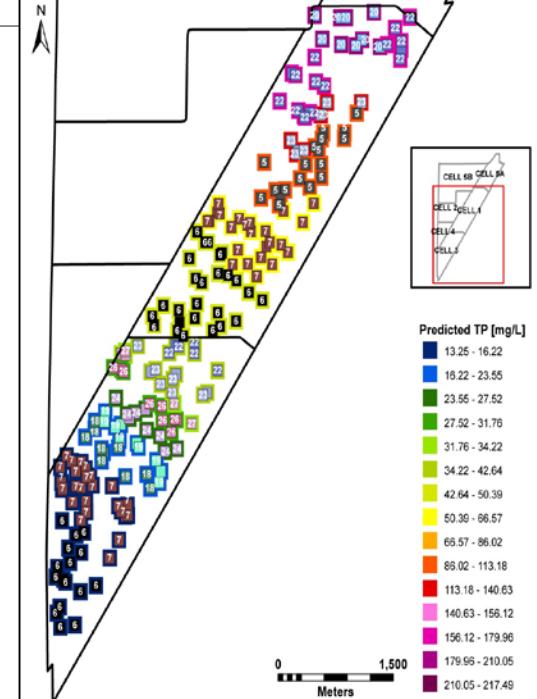
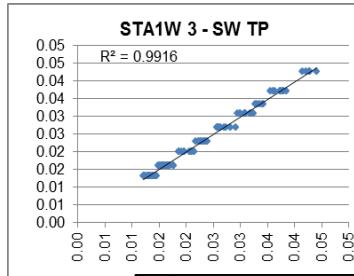
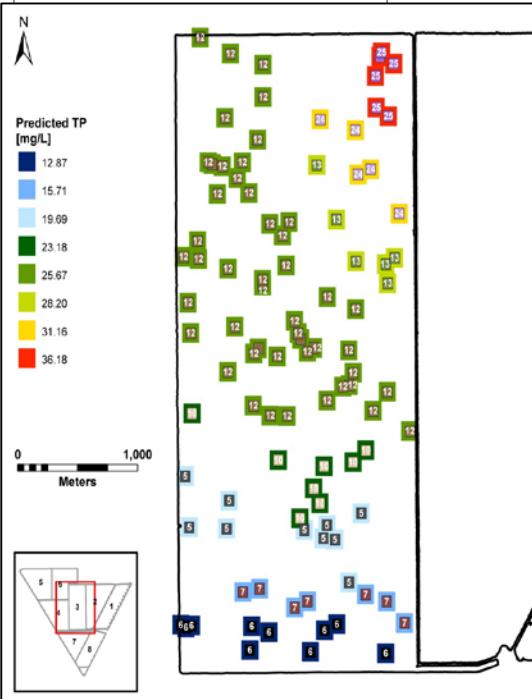
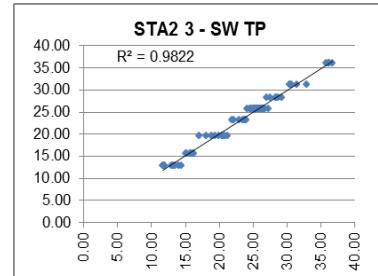
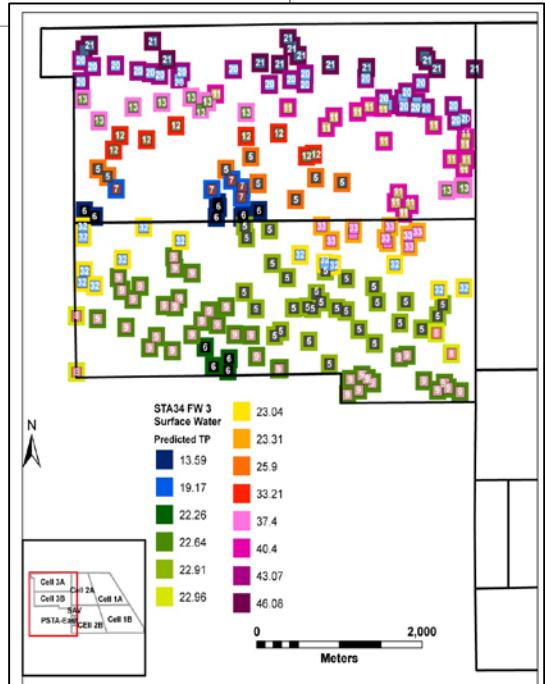
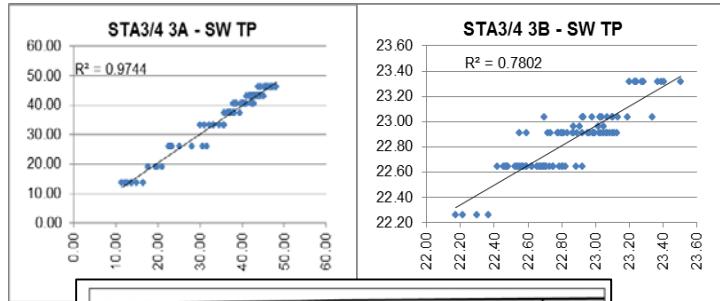
Exemplars



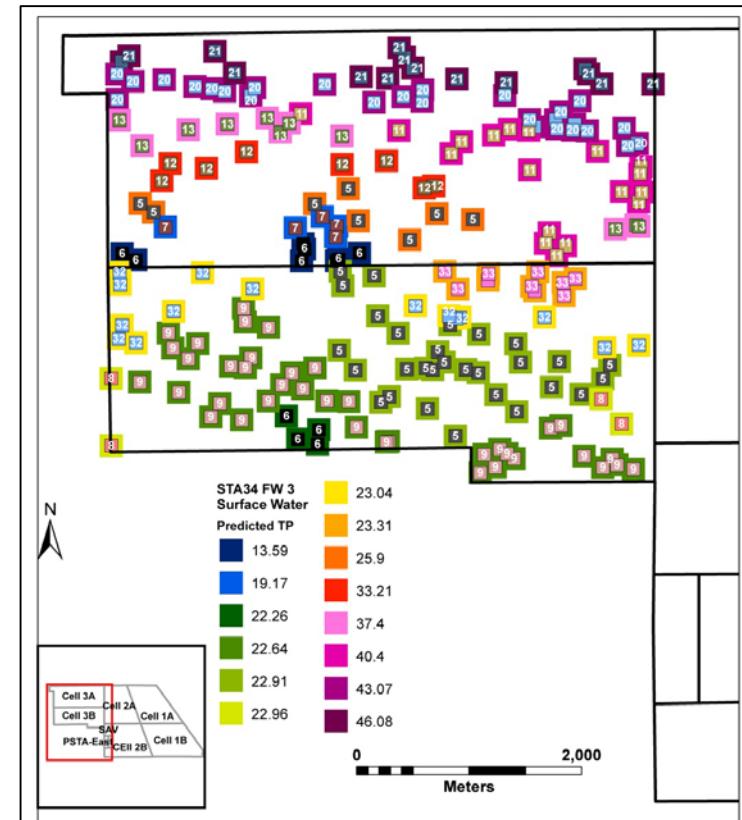
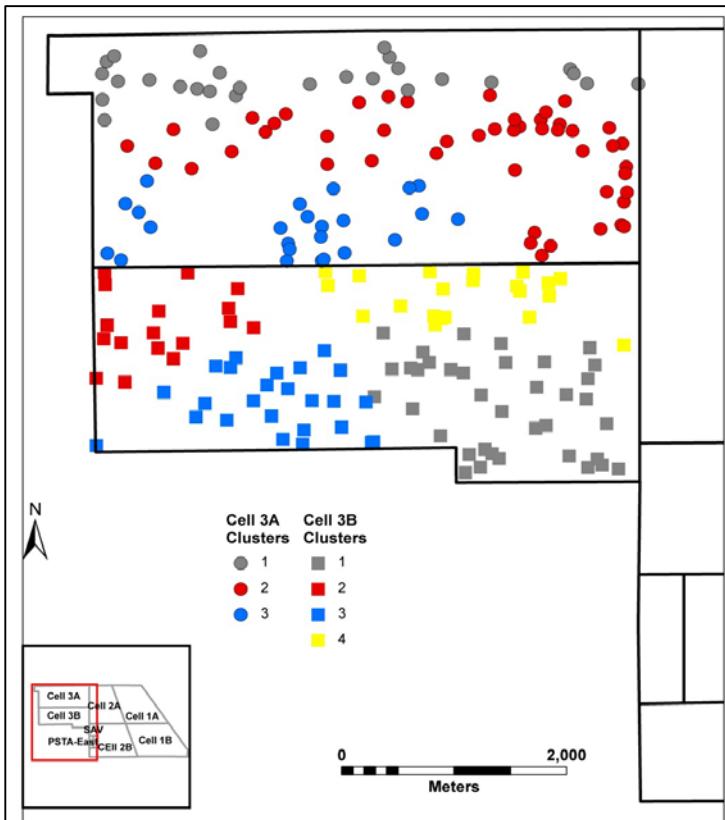
Spatial Analysis of a non-stationary process



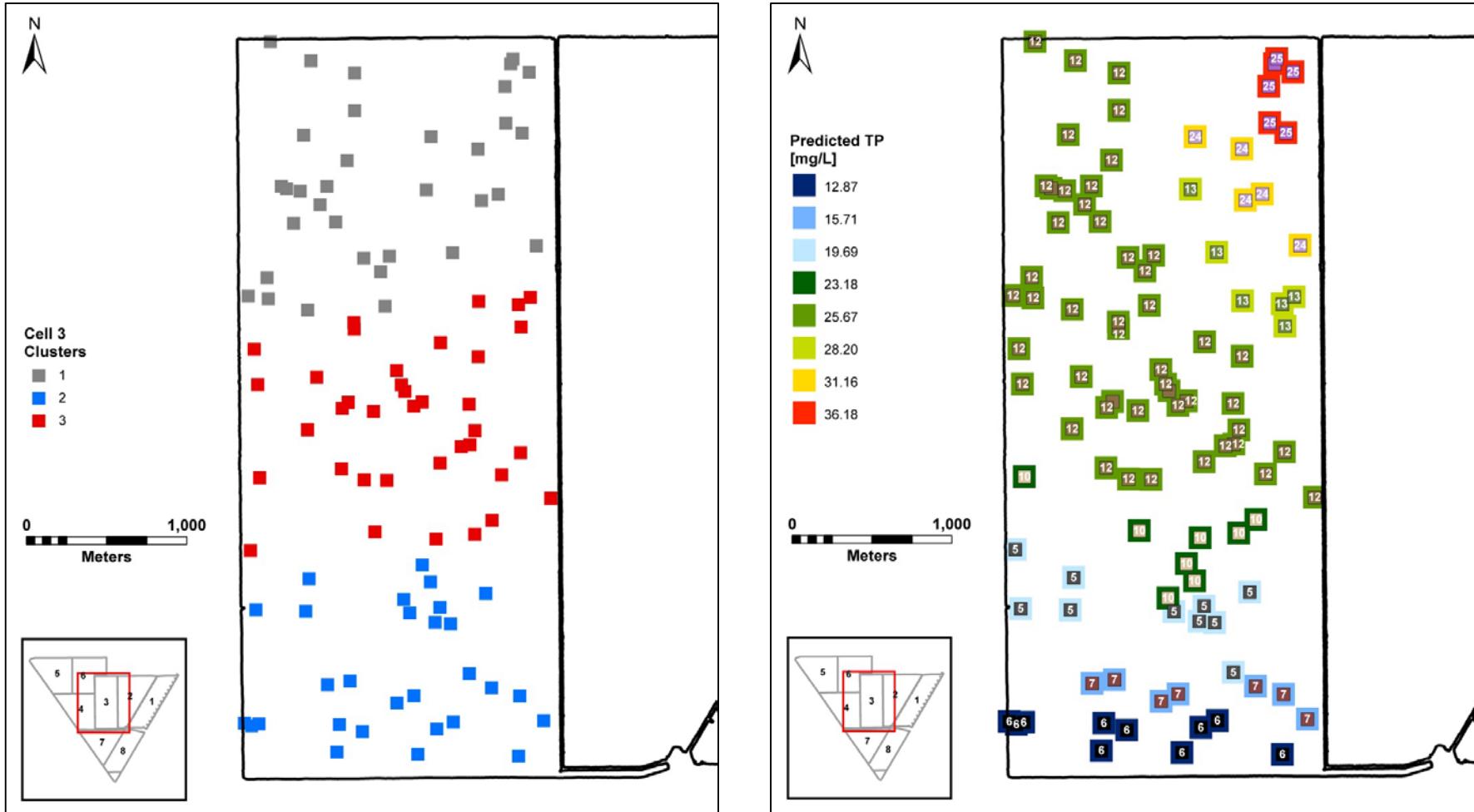
Modelling this a non-stationary process



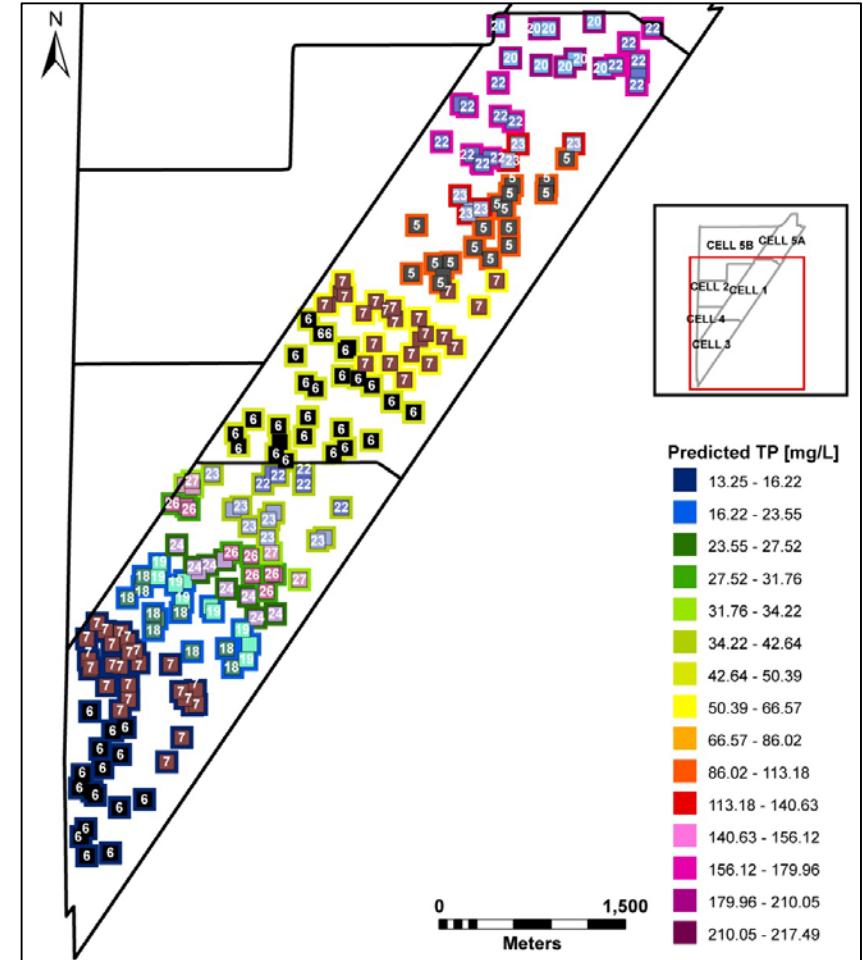
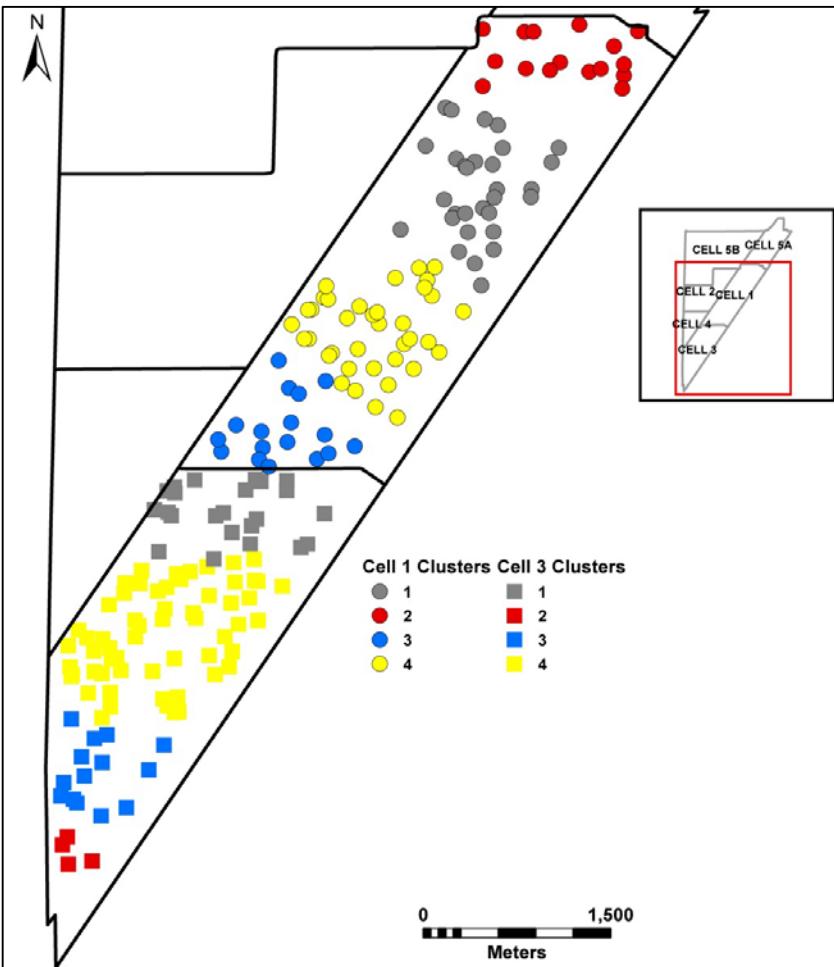
Verification of models vs patterns



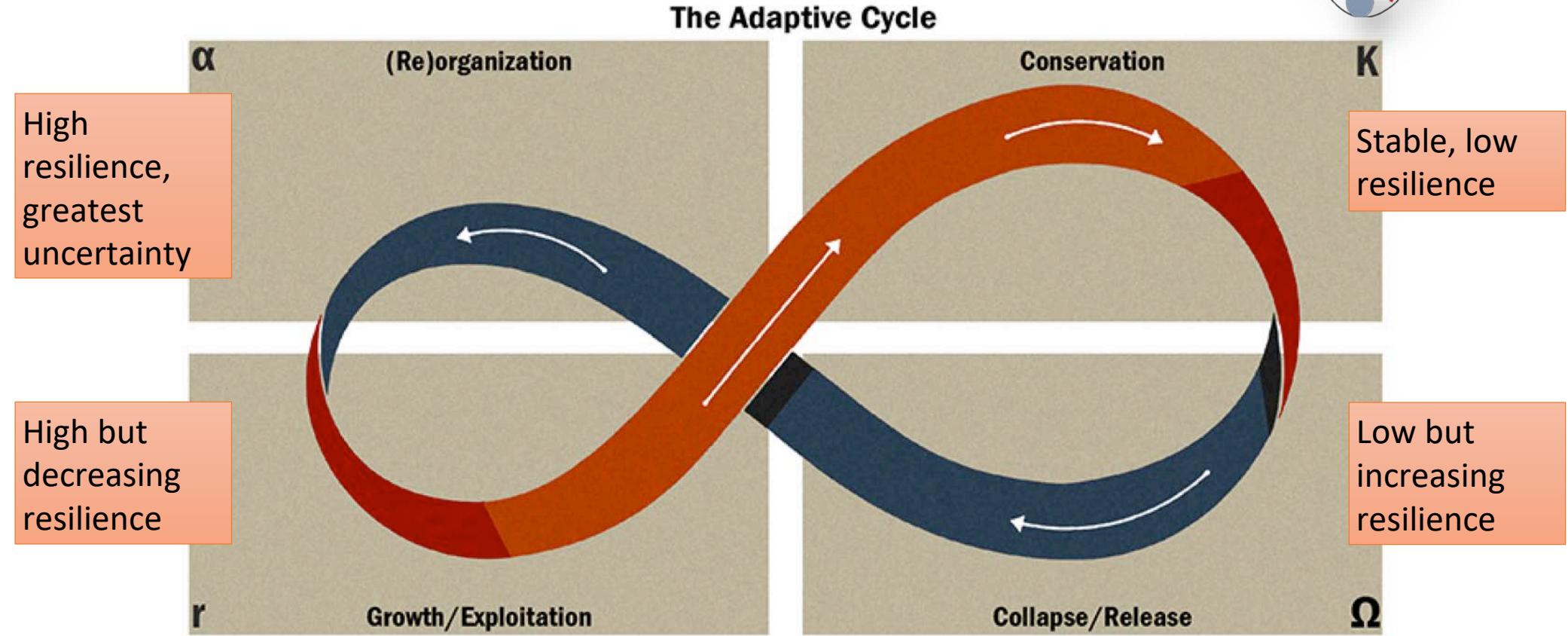
Verification of models vs patterns



Verification of models vs patterns



The adaptive cycle

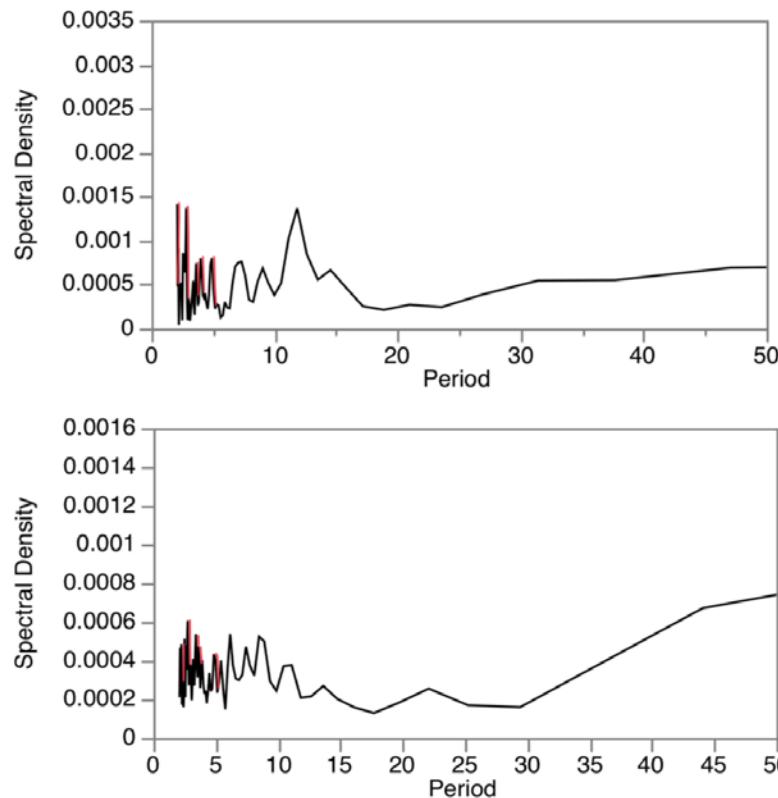


source: Holling, Gunderson and Ludwig, In Quest of a Theory of Adaptive Change, 2002

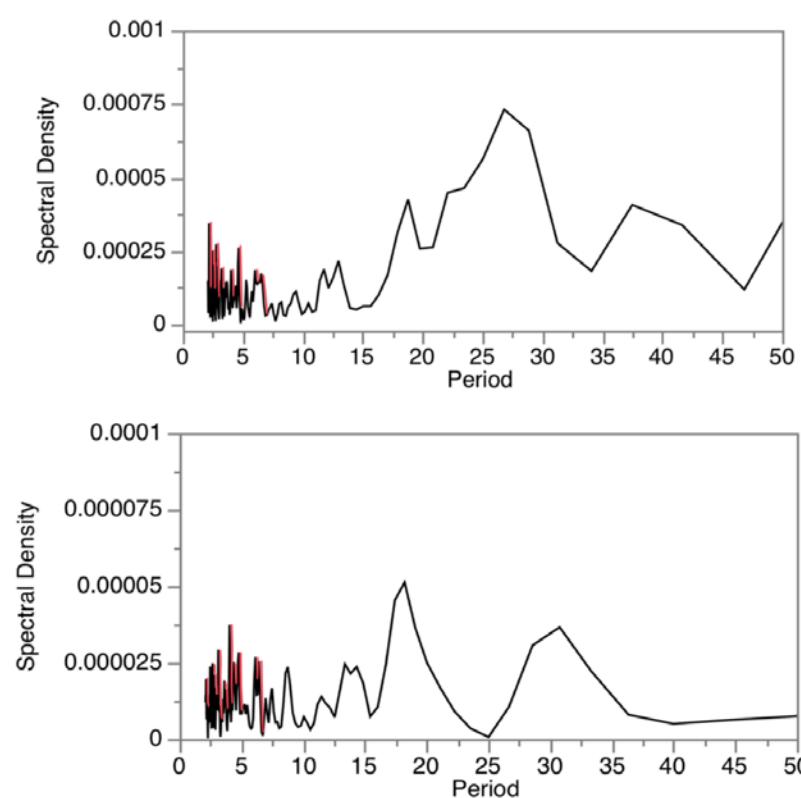
The Everglades Storm Water Treatment Areas: a found ecological experiment

Temporal Analysis: how resilient are these systems?

STA 2



STA 5/6



The Everglades Storm Water Treatment Areas: a found ecological experiment in resilience

If we now go back to our expectations; three board expectations represented in the data:

- 1) The systems broadly function as engineered systems,
- 2) The systems are self organizing ecological systems,
- 3) The systems are entirely stochastic

Unsurprisingly, they seem to operate as a hybrid of an engineered and self organizing ecological system.

