

## DEPARTMENTAL SEMINAR

# Spontaneous recovery and metastability in single and interacting networks

**Antonio Majdandzic**  
**Boston**

**University**

***Advisor:***  
**H. E. Stanley**

### **PhD Committee:**

W. Skocpol  
L. Sulak  
I. Vodenska  
R. Bansil  
H.E. Stanley

### ***Collaborators:***

B. Podobnik	L. Braunstein
S. Havlin	I. Vodenska
S. V. Buldyrev	C. Curme
D. Kenett	S. Levy-
Carciente	

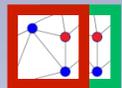
T. Inic

D. Horvatic

# Outline



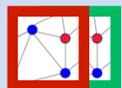
1. Introduction: failures & recoveries



2.1 **Single networks** phase diagram



2.2 Finite size effects (single networks)



3.1 **Interacting networks** phase diagram



3.2 Finite size effects & empirical support



## MOTIVATION

Let's start with  
one mystery:



Phenomenon:

Some **networks**, after they fail, are  
able to **become spontaneously active again**.



Examples:

- TRAFIC NETWORK**: traffic jams suddenly easing
- BRAIN**: people waking from a coma, or having seizures
- FINANCIAL NETWORKS**: flash crashes in finance

→ The process often occurs repeatedly: ***collapse, recovery, collapse, recovery,...***

We need: metastable states and nontrivial phase diagrams

We need a network model with failures and recoveries.

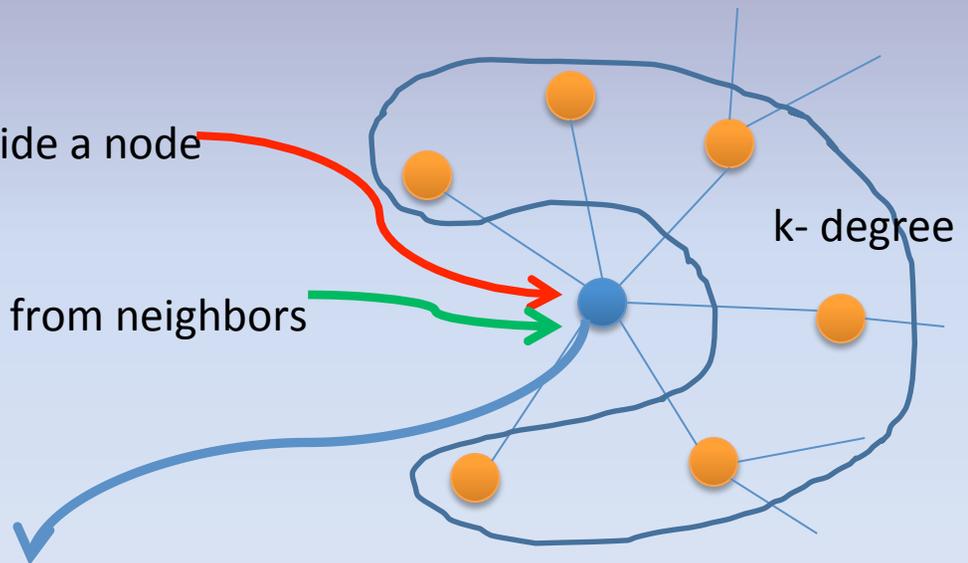


## 2.1. SINGLE NETWORK

- Each node in a network can be **active** or **failed**.
- We suppose there are **TWO possible reasons for the nodes' failures**: INTERNAL and EXTERNAL.

1. **INTERNAL failure**: intrinsic reasons inside a node

2. **EXTERNAL failure**: damage “imported” from neighbors



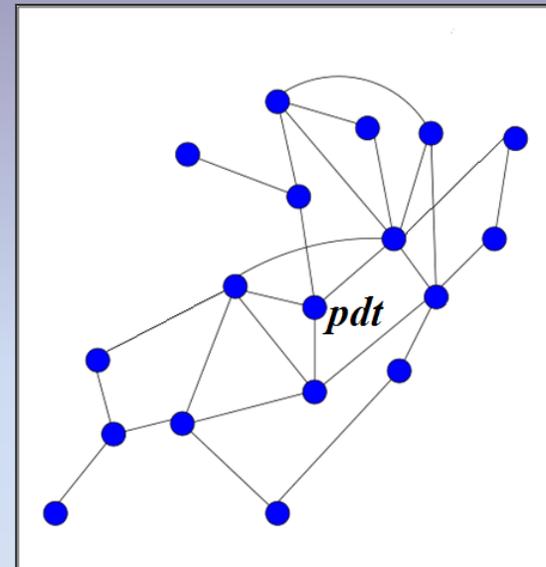
**RECOVERY**: A node can also **recover** from each kind of failure.

LET'S SPECIFY/MODEL THE RULES.

# 1. INTERNAL FAILURES

**p**- rate of internal failures (per unit time, for each node).  
During interval  $dt$ , there is probability  $pdt$  that the node fails.

**Recovery:** A node *recovers* from an internal failure after a time period  $\tau$ .



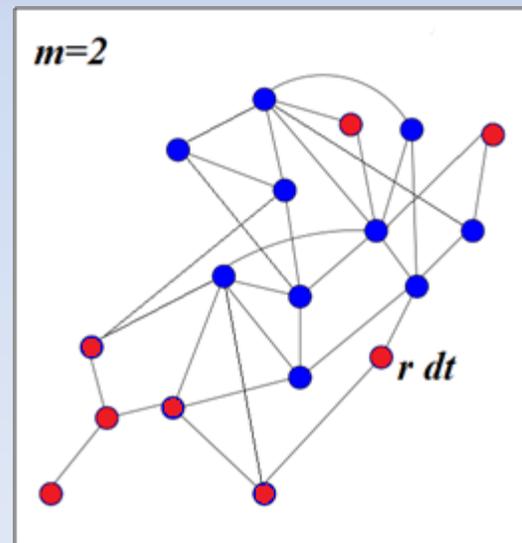
## 2. EXTERNAL FAILURES – if the neighborhood of a node is too damaged

IF: “CRITICALLY DAMAGED neighborhood”: **less than or equal to  $m$  active neighbors**,  
where  $m$  is a fixed treshold parameter.

THEN: There is a probability  $r dt$  that the node will experience externally-induced failure during  $dt$ .

$r$  - external failure rate

*A node recovers from an external failure after time  $\tau'$ .*



FAILURE TYPE	RULE	RECOVERY
Internal failure	With rate $p$ on each node	After time $\tau$
External failure	IF ( $\leq m$ active neighbors) THEN Extra rate $r$ on each node	After time $\tau'$

Out of these 5 parameters, we fix three of them:  
 $m=4$ ,  $\tau=100$  and  $\tau'=1$ .

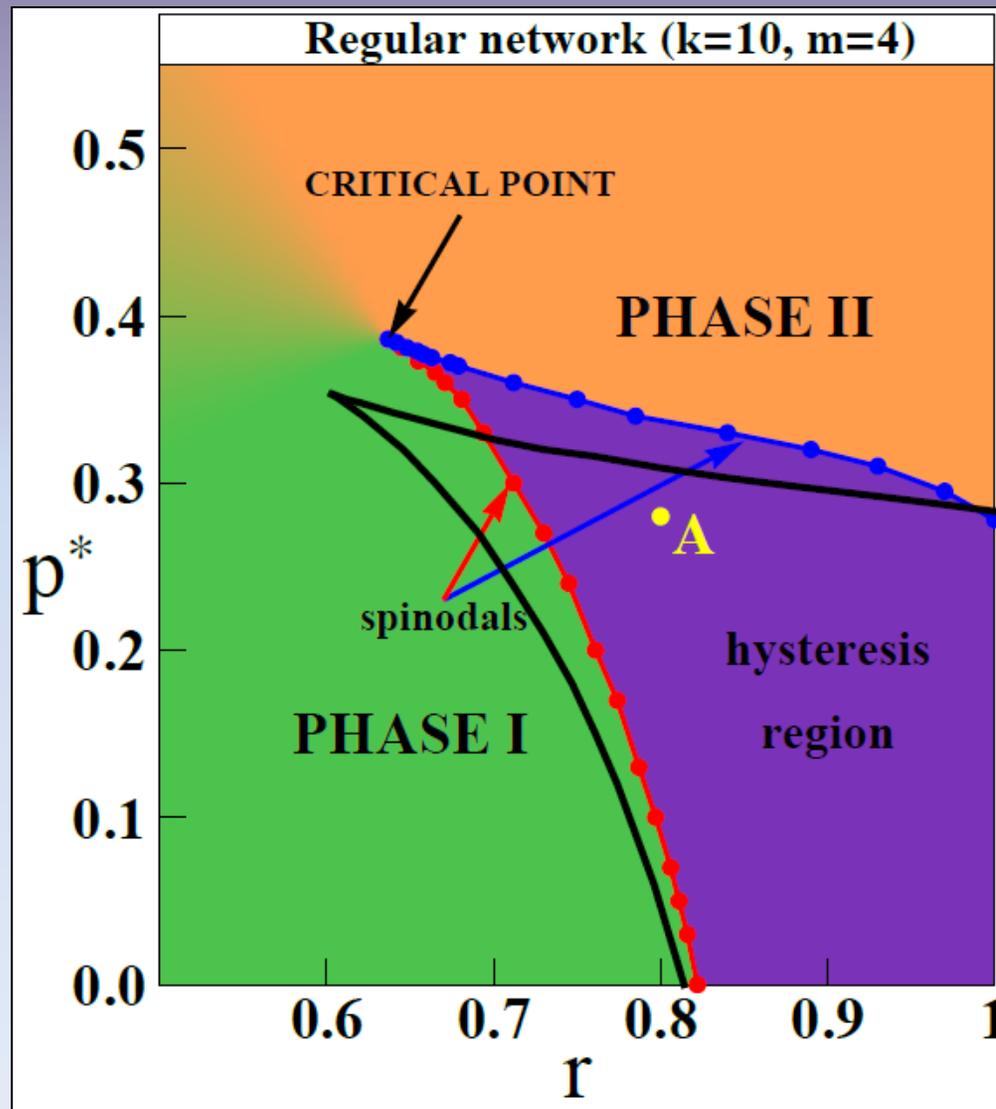
We let  $(p,r)$  to vary.

It turns out it is convenient to define  $p^*=exp(-p\tau)$ .  
 So we use  $(p^*,r)$  instead of  $(p,r)$ .

We measure activity  $Z$  of the network as a function of  $(p^*,r)$ .



# Phase diagram (single network, random regular)



GREEN; High activity Z  
ORANGE: Low activity Z

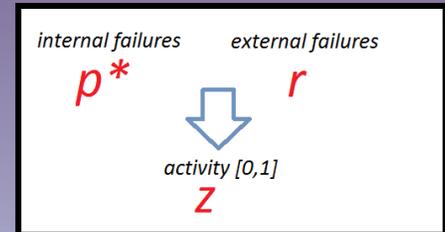
In the hysteresis region both phases exist, depending on the initial conditions or the memory/past of the system.

Blue line: critical line (spinodal) for the abrupt transition I  $\rightarrow$  II

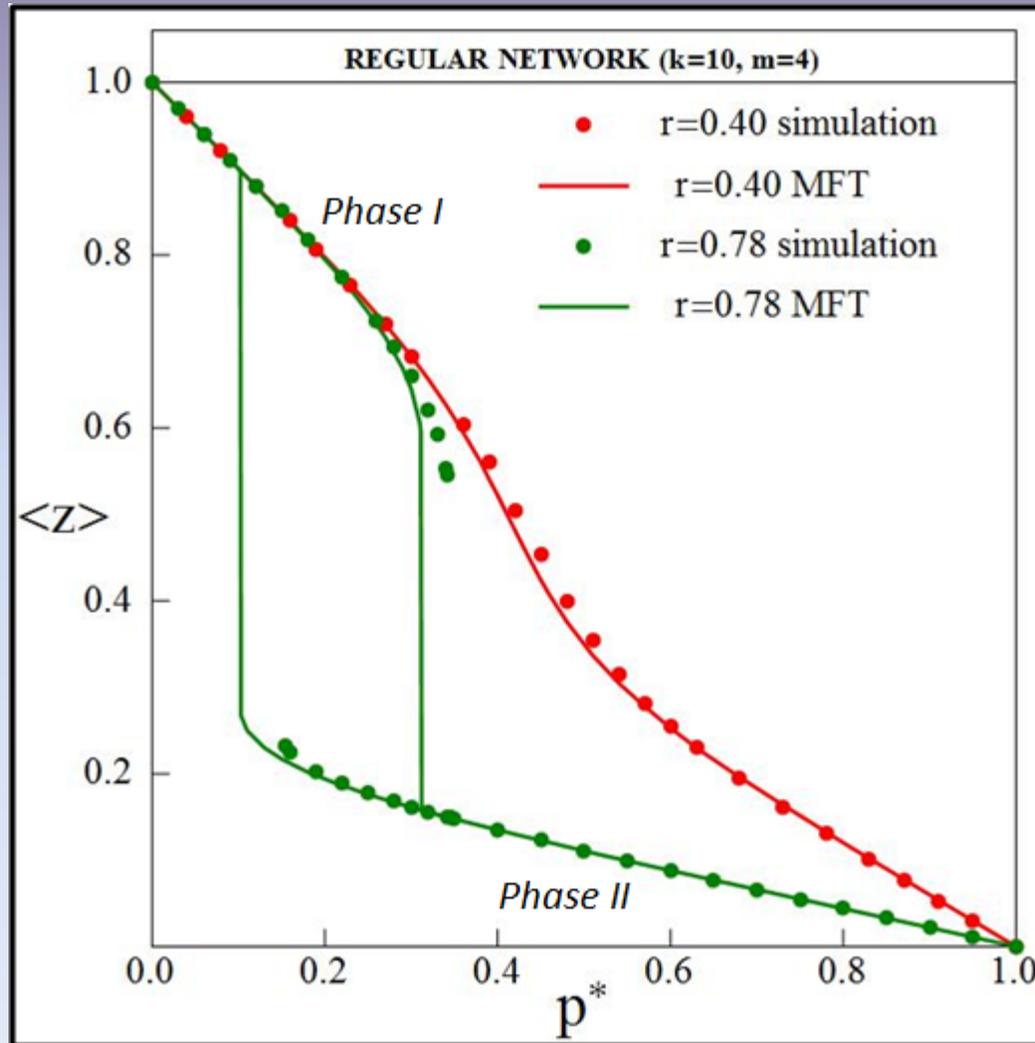
Red line: critical line (spinodal) for the abrupt transition II  $\rightarrow$  I



# Model simulation [Random regular networks]



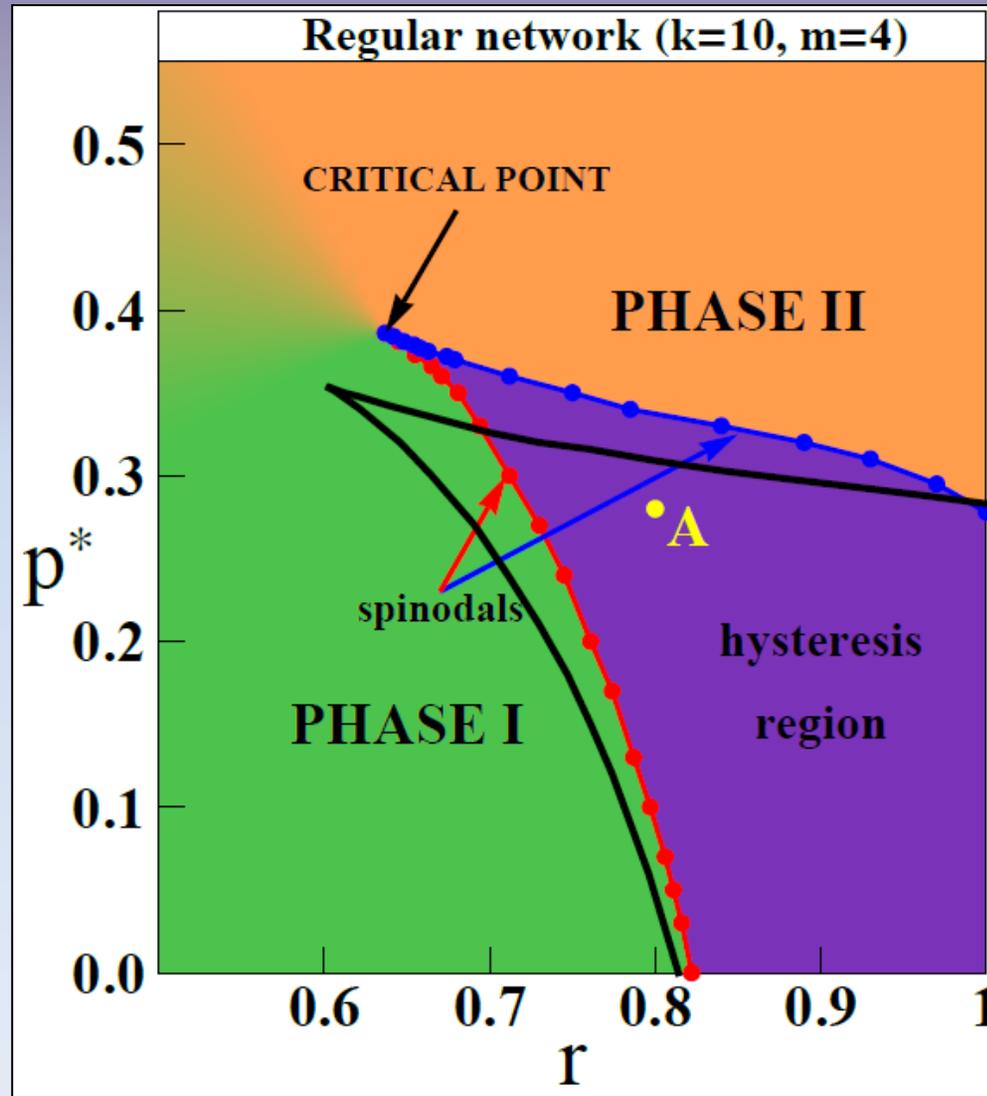
$\langle Z \rangle$  - average fraction of active nodes (Z fluctuates)



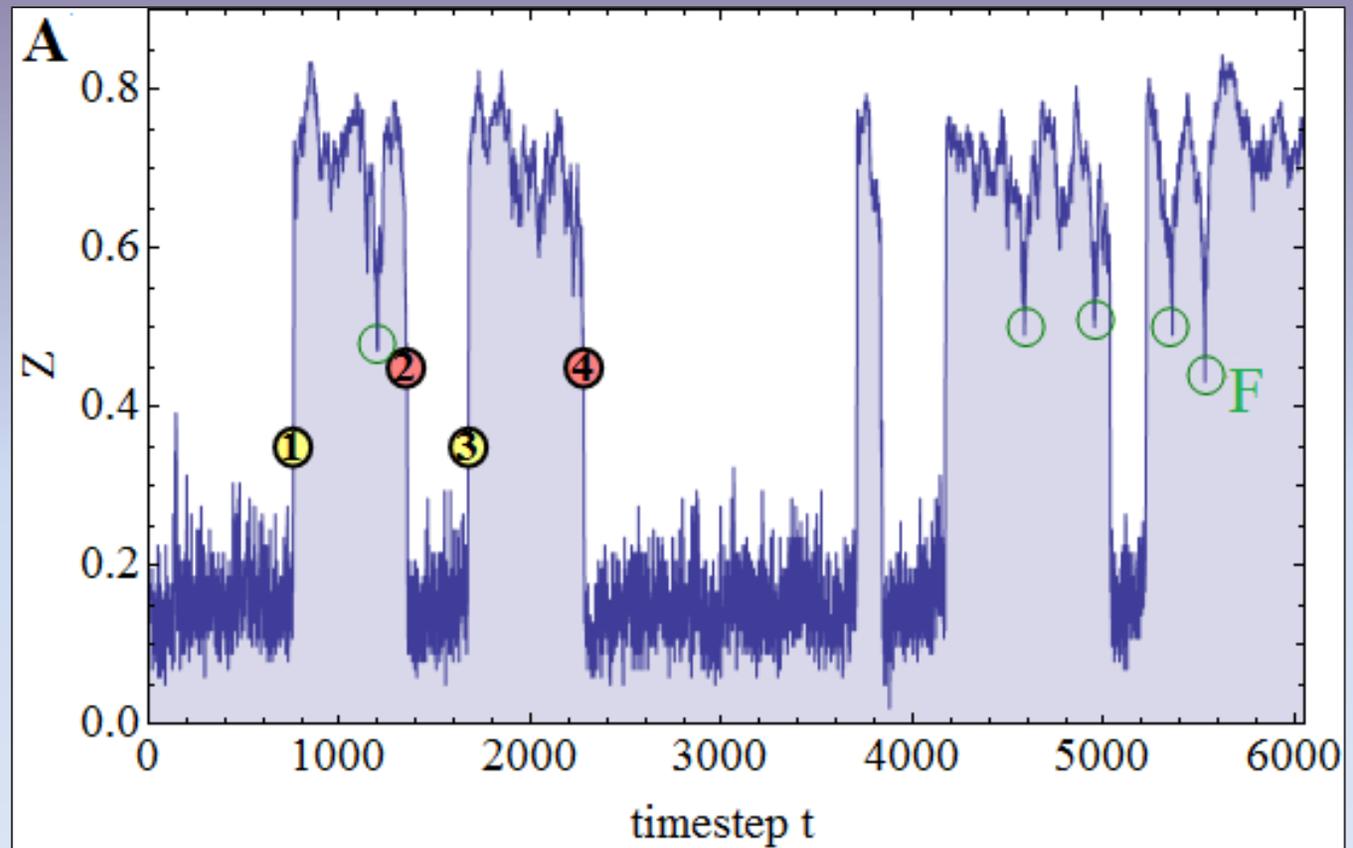
We fix  $r$ , and measure  $\langle z \rangle(p^*)$

For some values of  $r$  we have a hysteresis loop.

Let's pick point A, take a small system  $N=100$ , and run the simulation



# Finite size effects

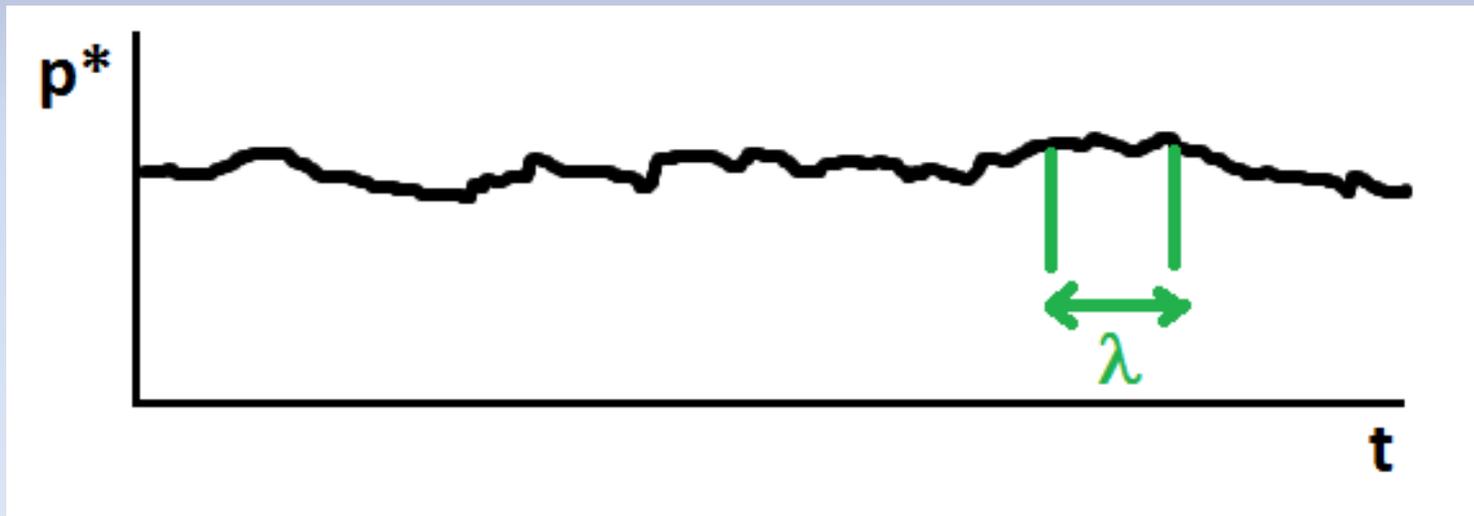


Sudden transition!

1. Why? How?

2. Is there any  
forewarning?

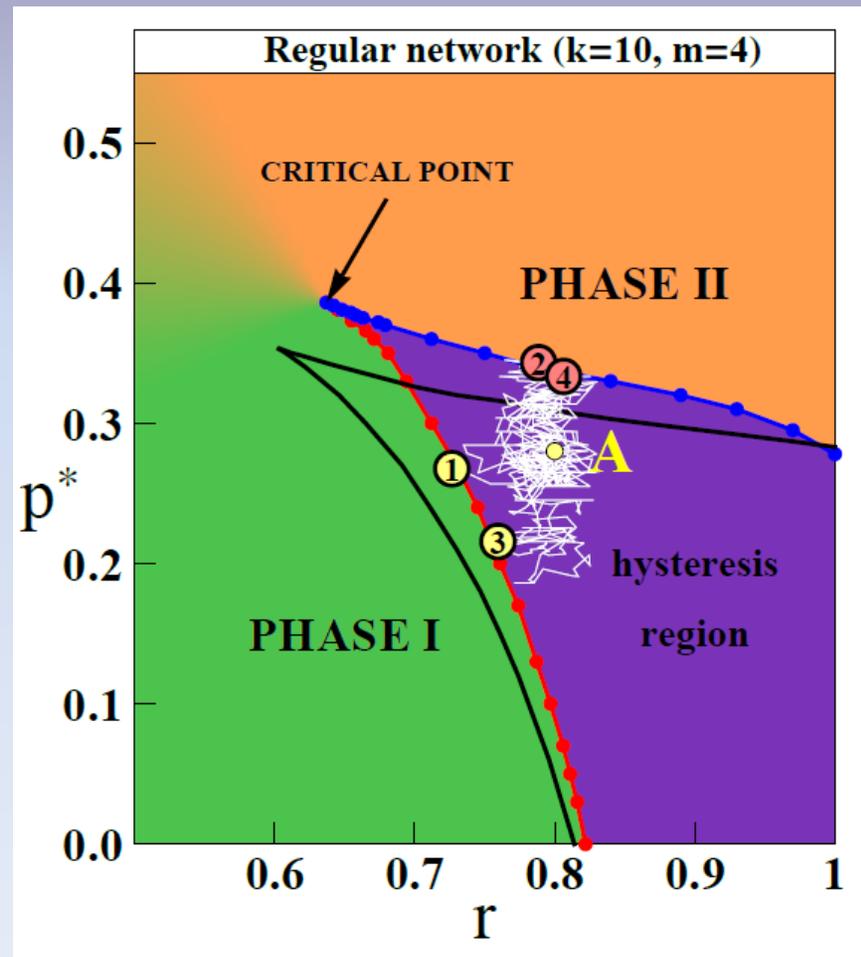
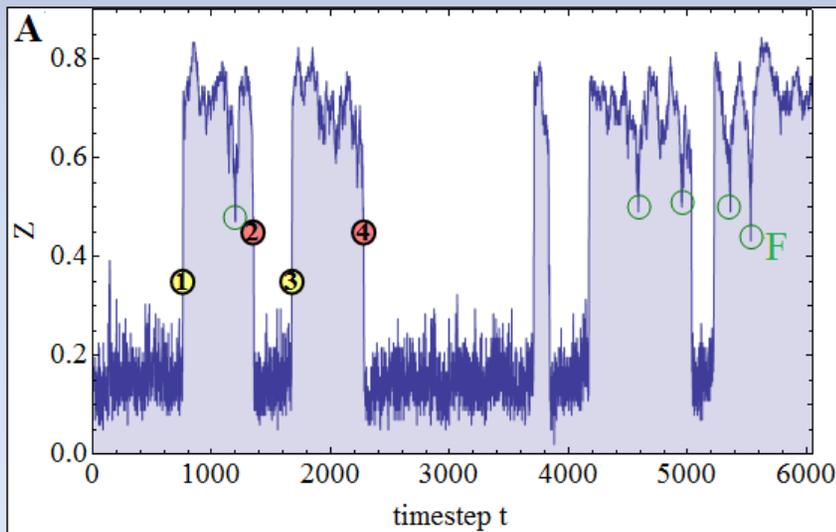
( Remember :  $Z$  = Fraction of active nodes )



It turns out it can be predicted.

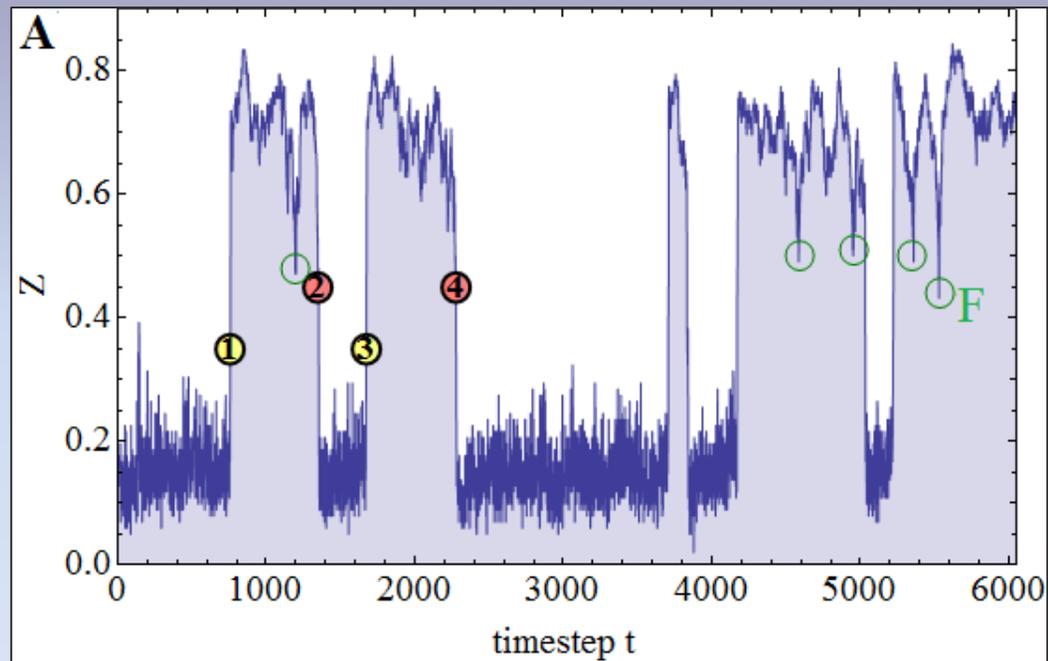
Trajectory  $(r_\lambda(t), p_\lambda^*(t))$  in the phase diagram (white line, see below).

The trajectory crosses the spinodals (critical lines) interchangeably, and causes the phase flipping.



## Second finite size phenomenon: Flash crashes

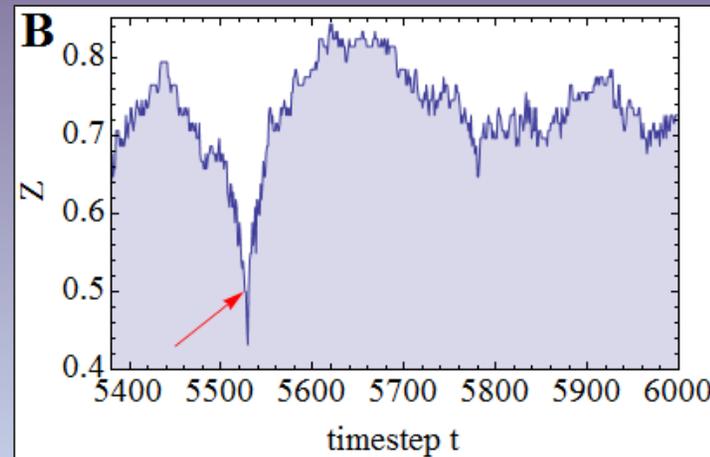
An interesting (and unexpected) by-product of the model:



Sometimes the network rapidly crashes, and then quickly recovers (green circles).

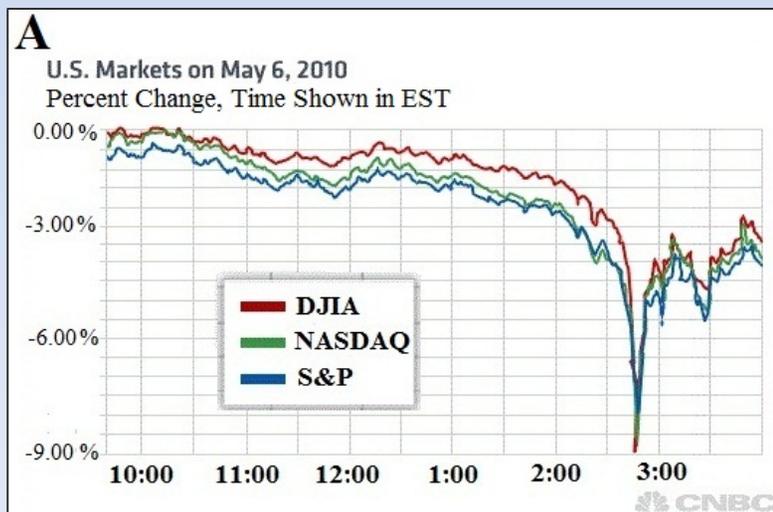
Model predicts the existence of “flash crashes”.

Explanation: Unsuccessful transitions to a lower state.



Real stock markets also show a similar phenomenon.

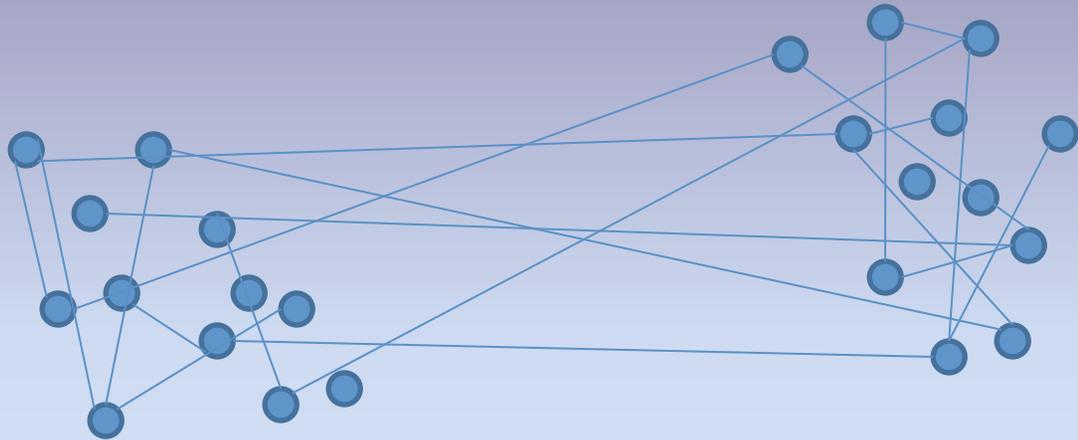
Q: Possible relation?



“Flash Crash 2010”



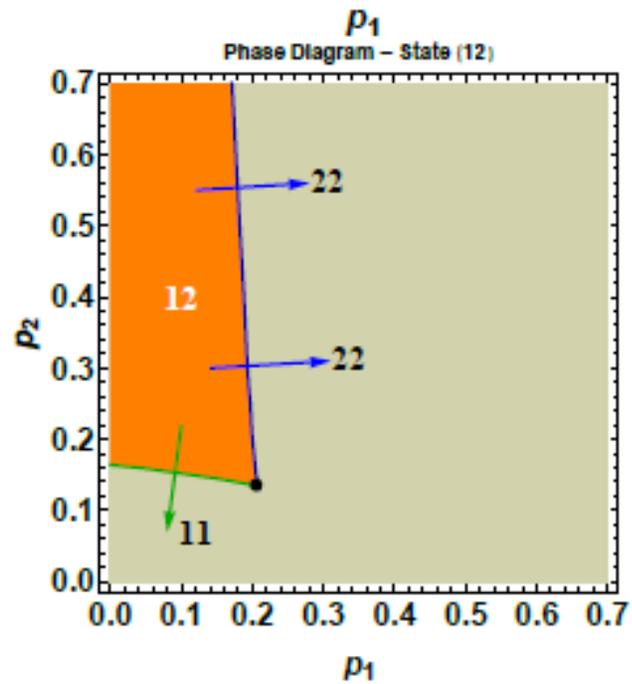
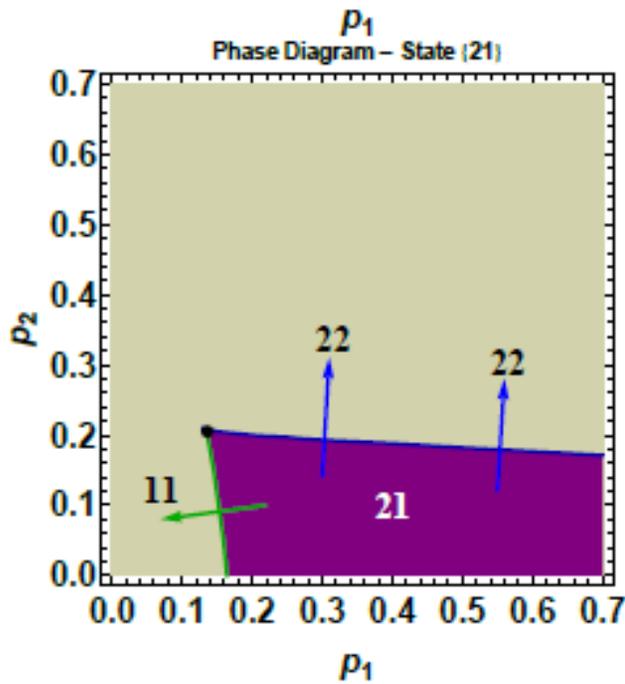
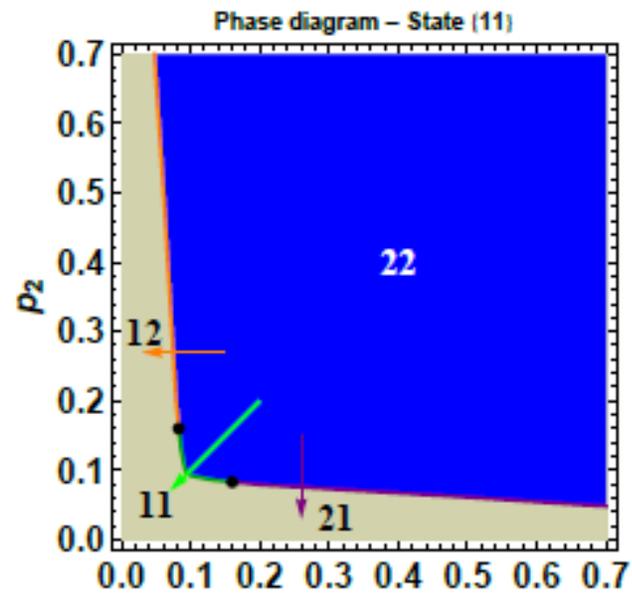
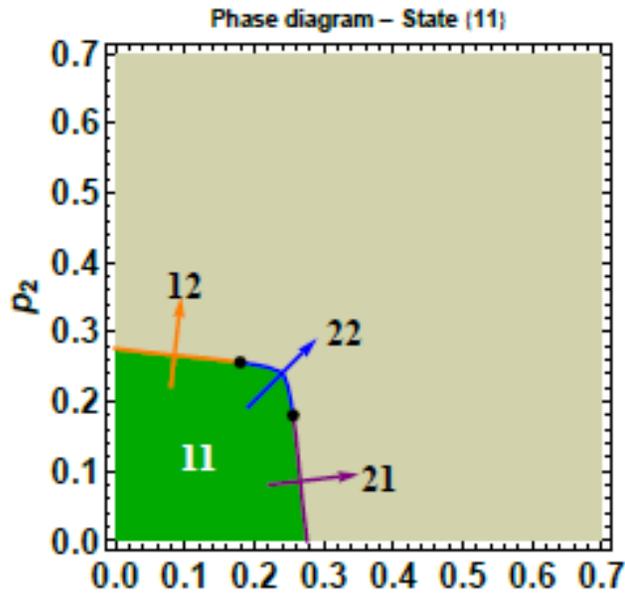
## 3.1. Interacting networks



Network A

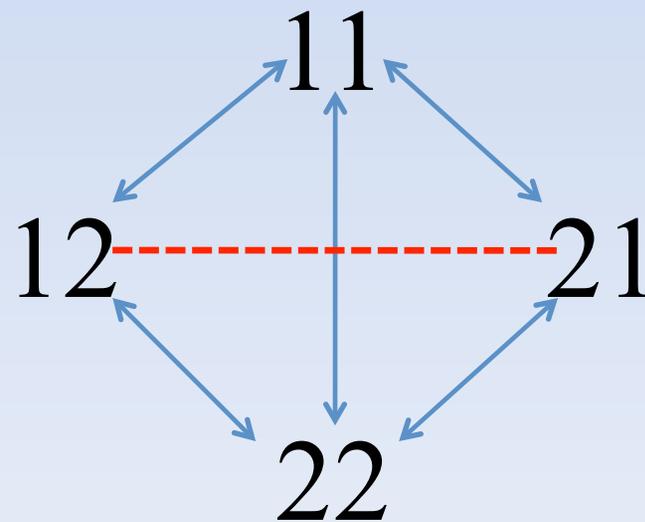
Network B

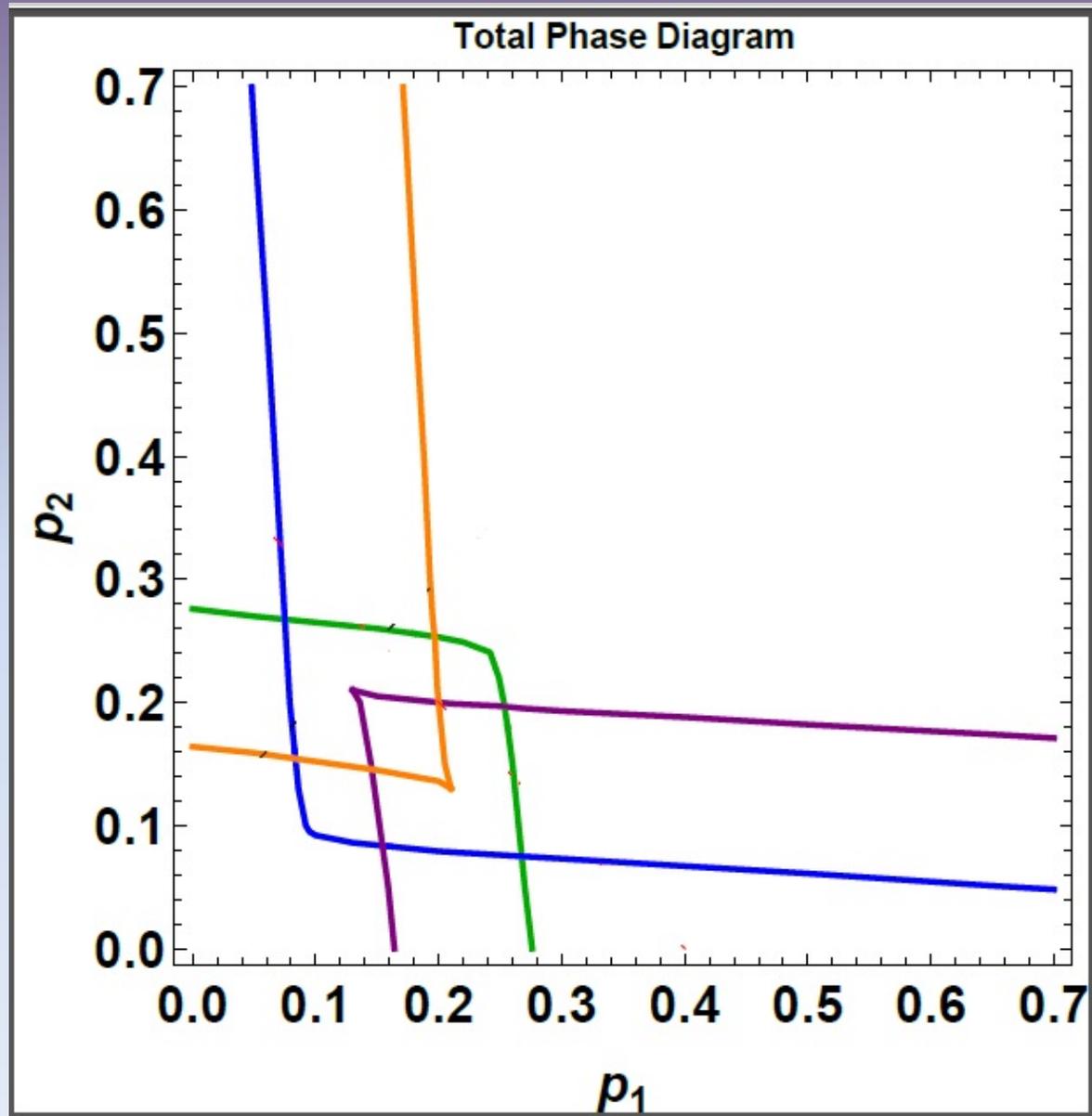
FAILURE TYPE	RULE	RECOVERY
Internal failure	With rate $p$ on each node	After time $\tau$
External failure	IF( $\leq m$ active neighbors) THEN Extra failure rate $r$	After time $\tau'$
Dependency failure	IF(companion node from the opposite network failed) THEN Extra failure rate $r_d$	After time $\tau''$



# Elements of the phase diagram

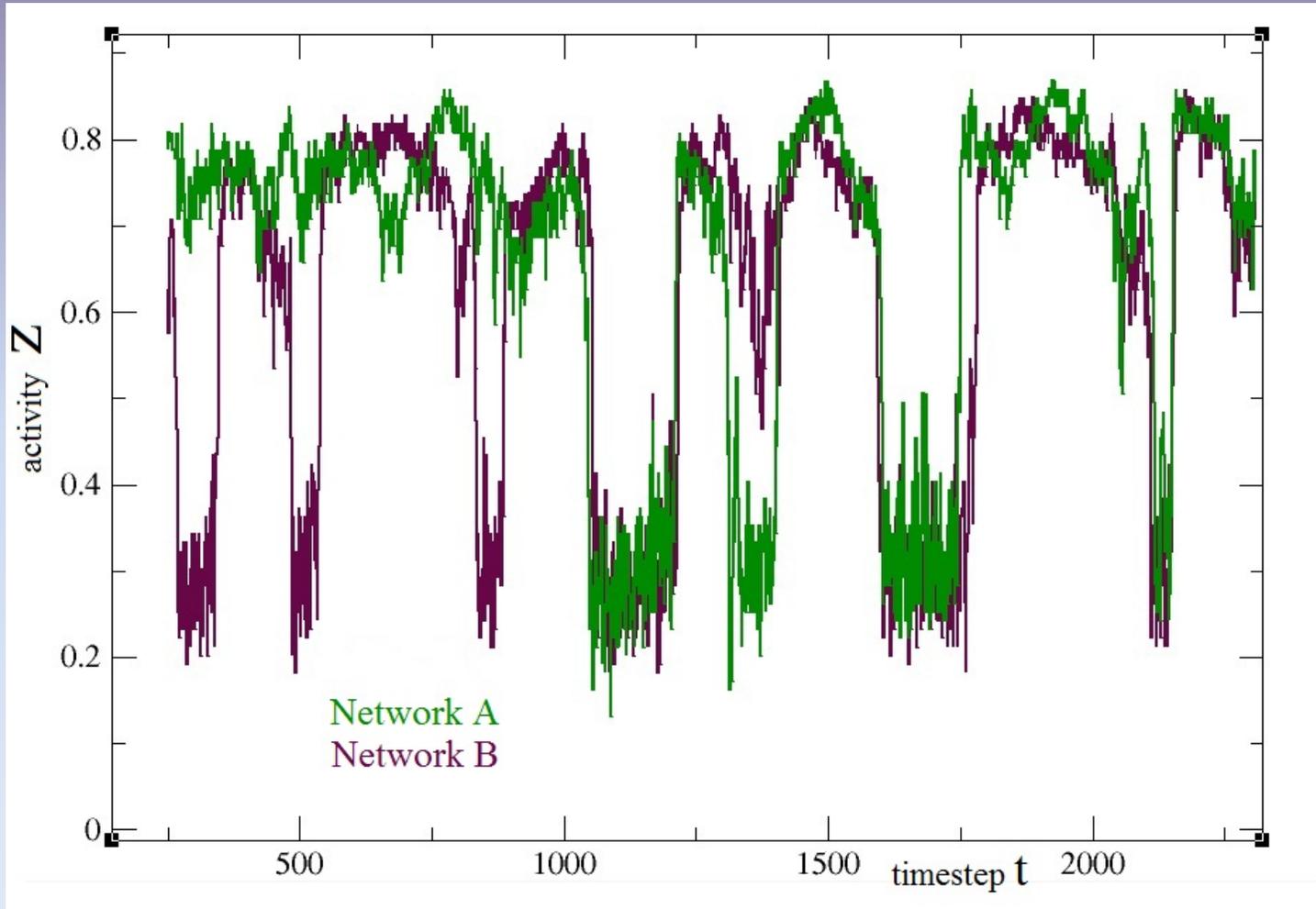
- 2 critical points
- 4 triple points
- 10 allowed transitions
- 2 forbidden transitions



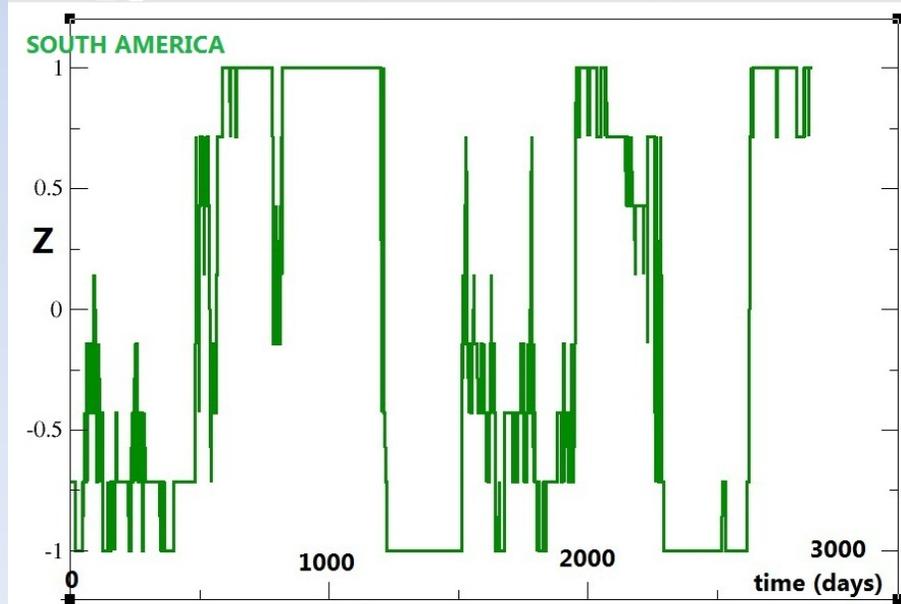
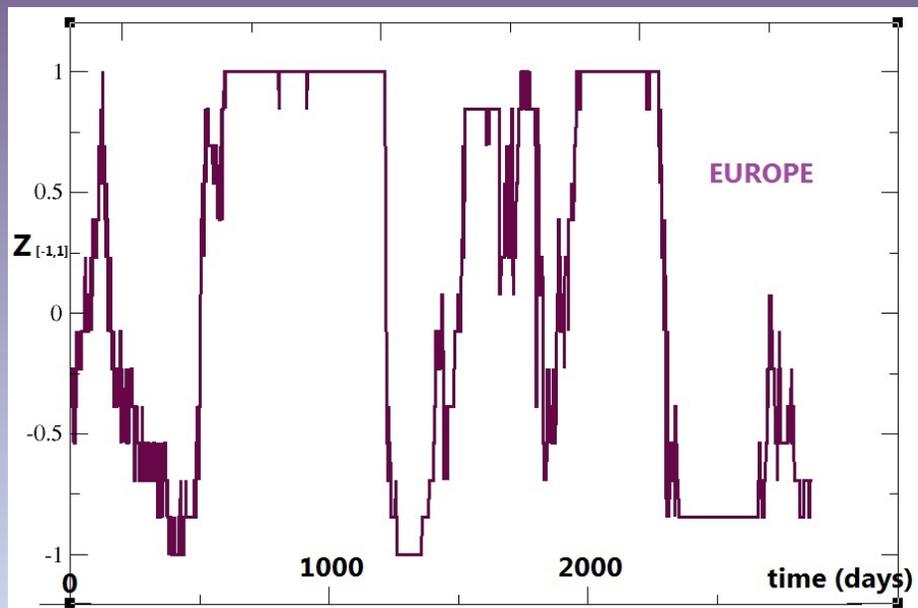




## Two interacting networks: phase switching (MODEL)



CDS  
(real data)



- Thank you for your time.

# BONUS: Problem of optimal treatment

