### ECONOPHYSICS: PY538

- broadbrush today....details in <a href="http://polymer.bu.edu/~hes/">http://polymer.bu.edu/~hes/</a>
- work by (one could wish no finer collaborators):

Gabaix (Fisher-Black Prize!), Salinger, Pammolli, Riccaboni, Podobnik, Preis, Moat, Vodenska, Buldyrev, Havlin, Mantegna, Gopikrishnan, Plerou (Young Scientist Prize), Petersen, Liu, Cizeau, Fu, D. Wang, H. Wang, F. Wang, Bertella, X. Huang, S. Zhang, G. Li, J. Wu, S. Levy, X. Feng, Yamasaki, Rosenow, Amaral, Ivanov, Matia, W-X Zhou, Z. Q. Jiang, Weber, Chessa, Gou, Lee, Meyer, Y-H Shao, Carbone, Ben-Jacob, Kenett, Fu, Majdanzic, Schneider, Curme, Avakian, Su, Lu, S. Shao, Ling, H. Huang,

### & YOU [??]

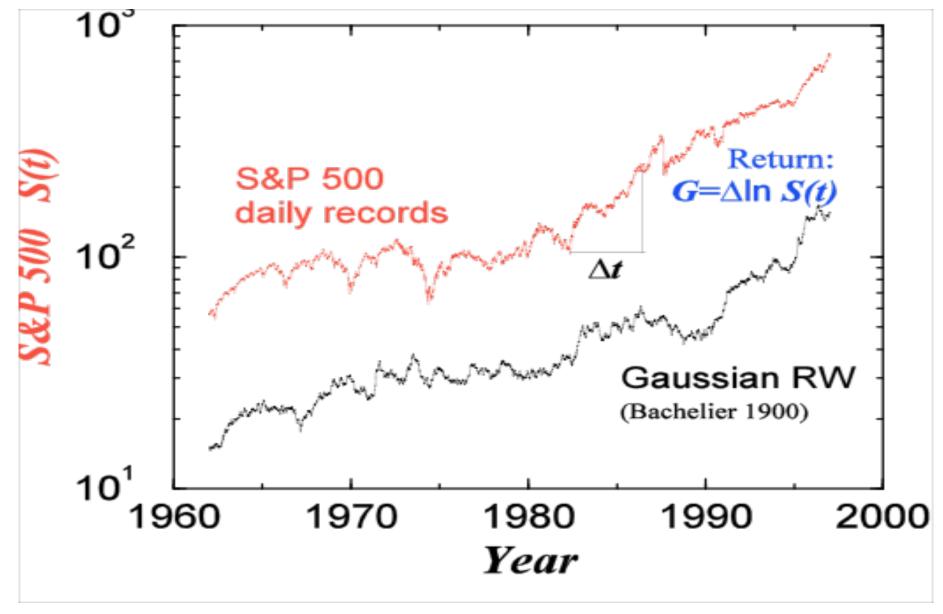
INVITATION: please consider to come to Rm.204..... i will welcome you at any time!

# Can physicists contribute to economics/finance?

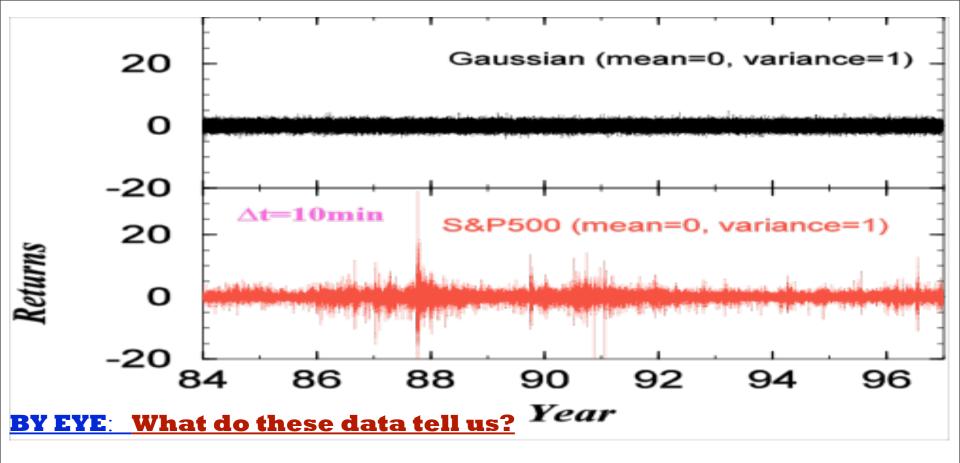
- get an economics partner...& respect him/her!
- get as much data as exists ("big data")
- ask "What are these data telling us?"
- to find out, quantify each finding...
- Do not be too timid: e.g., Aggregate, ...
- try to relate all findings (ex: price, volume, intertrade times, volatility,...)
- Make "model" relating all facts ("cheating"?)

Dedication: TINBERGEN/EHRENFEST the first econophysicists?

#### THE PUZZLE: "SWITCHING WITHOUT SWITCHES"



"Big switch": 19 Oct. 1987 (25% worldwide "earthquake/tsunami")



Q: can your **eye** see the power law? that it is inverse cubic?

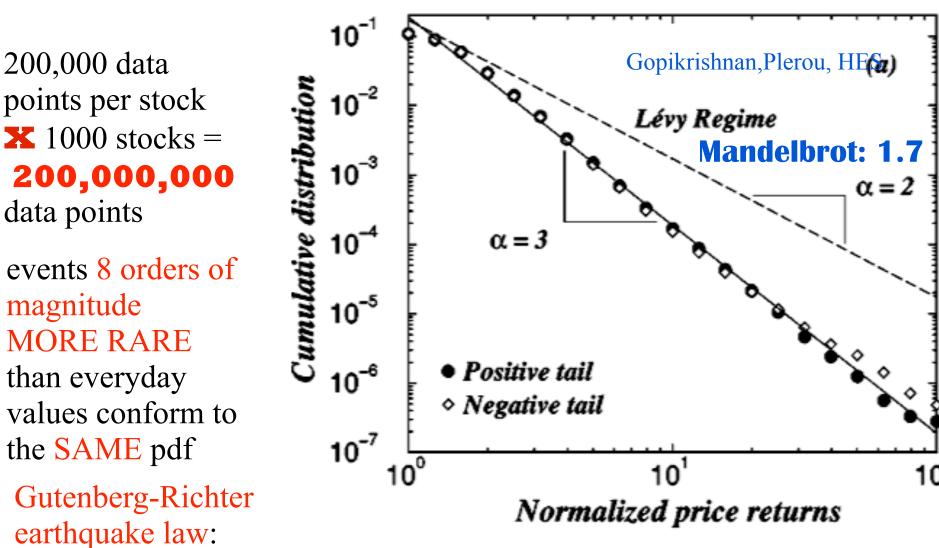
Returns non-Gaussian (known qualitatively, but under-appreciated!)

Large events cluster (like earthquakes) (also known qualitatively)

"Aftershocks" Omori-correlated (Palermo 03; BU 07)

"Aftershocks of each aftershock" also Omeri correlated: (BII)

holds over 6 orders of magnitude on y-axis (8 for pdf: inverse quartic)



**Note**: there is NOT a perfect power law due to corrections at both ends of a power law region, just as for power laws in turbulence.

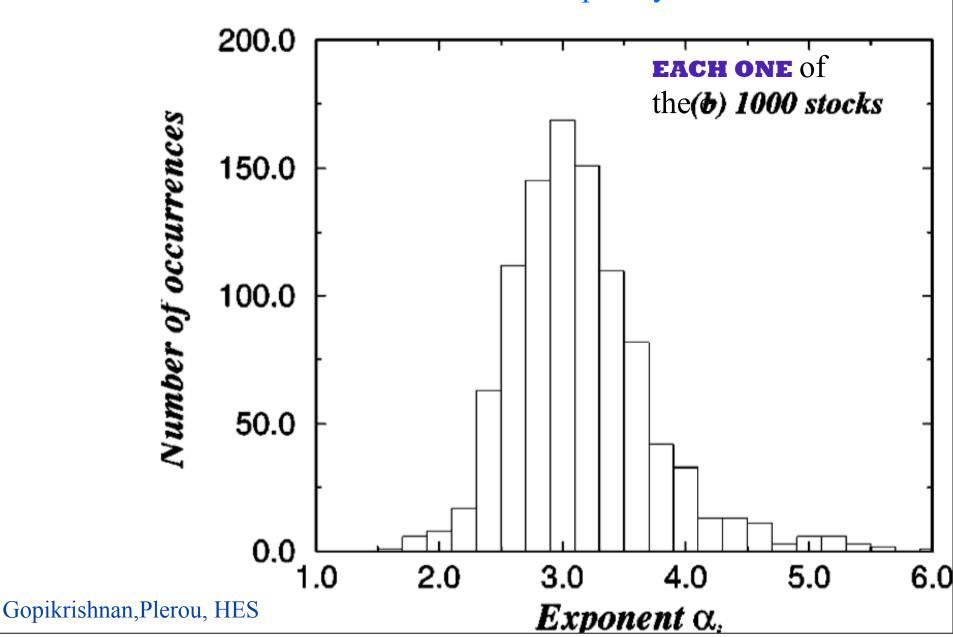
Thursday, January 30, 14

as mag = 1 quake

mag = 7 quake **same** law

#### Aggregating is also "cheating"??

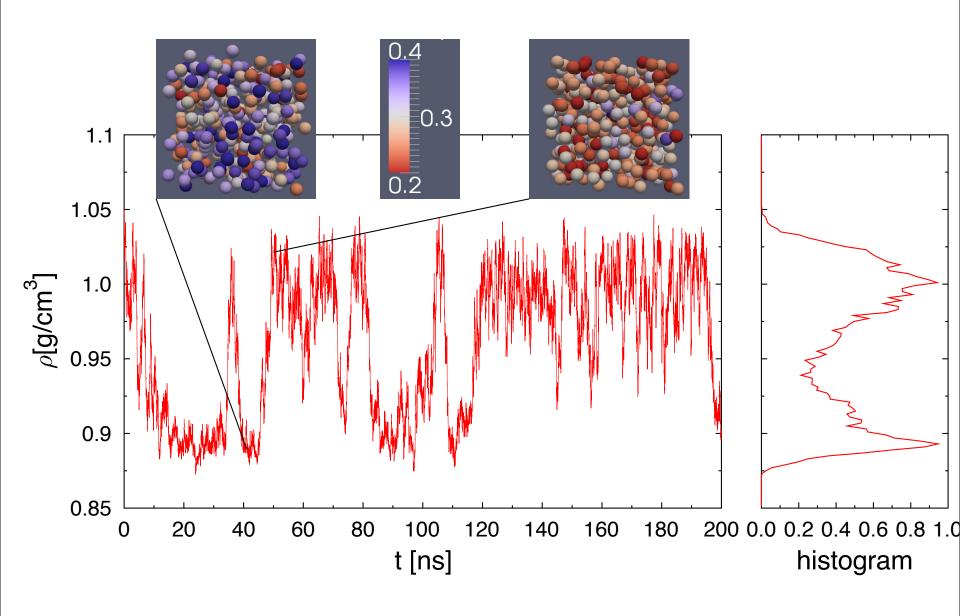
Find that inverse cubic law holds "microscopically" for each stock

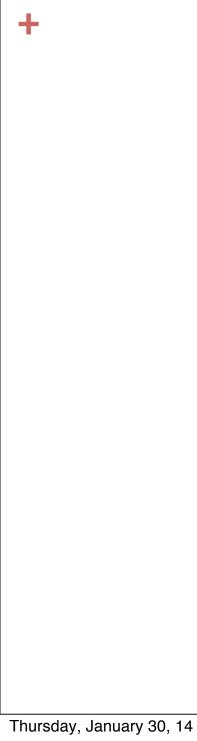




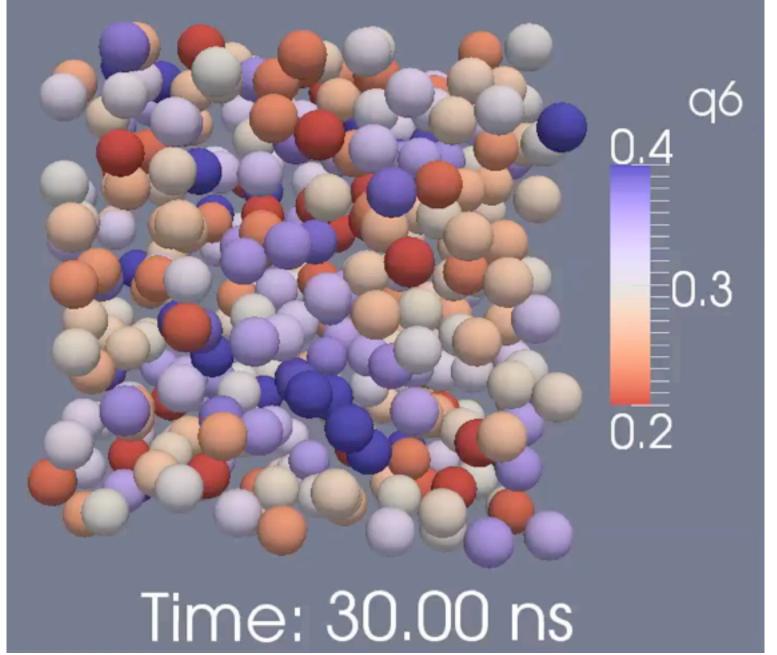


#### water: time dep. for 1 state point near ph. trans. line:









### "How?" "Models?": Herd vs. News?

(1) "herd effect" (exchange int. J). (2) news effect (external field H)

Each stock is a unit, interacting with other stocks (units) and bathed in a magnetic field H.

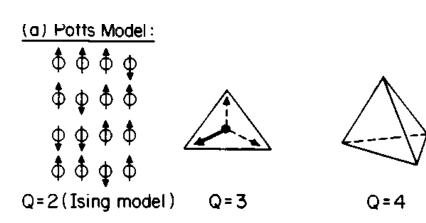
J depends on the two stocks, and

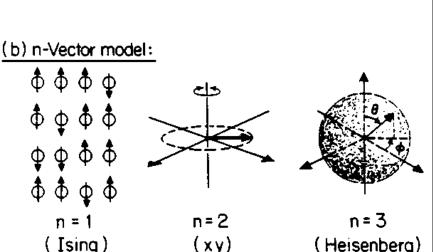
H depends on the two stocks, and H depends on the stock. Both can change with time.

#### **Possible** models:

- (a) Units can be in Q different DISCRETE states: "Potts Model" (Potts 1952).
- (b) n-dimensional units. Each can be in a CONTINUUM of states: "n-Vector Model" (HES 1969)

(c) modified Edwards-Anderson "spin glass" (w/ t-dep interactions)





#### **PUZZLE:**

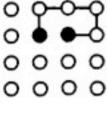
How does a paramagnet "know" when to spontaneously order itself?

### (a) Order v¹: m → n

(b) Order  $v^3$ : m = n

**HERD EFFECT (magnet)** 

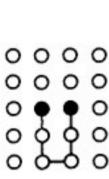
When the balances the exponential increase in the









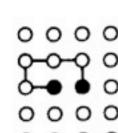


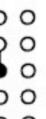
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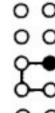
#### **ANSWER:**

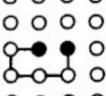
exponential decay (c) Order  $v^5$ : along a 1-d path number of paths.

$$v = J/kT = n.n.$$
 coupling strength







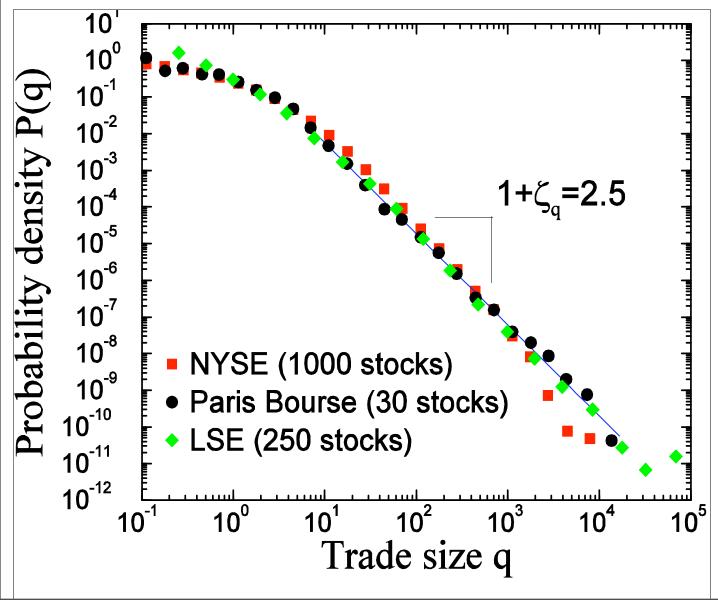


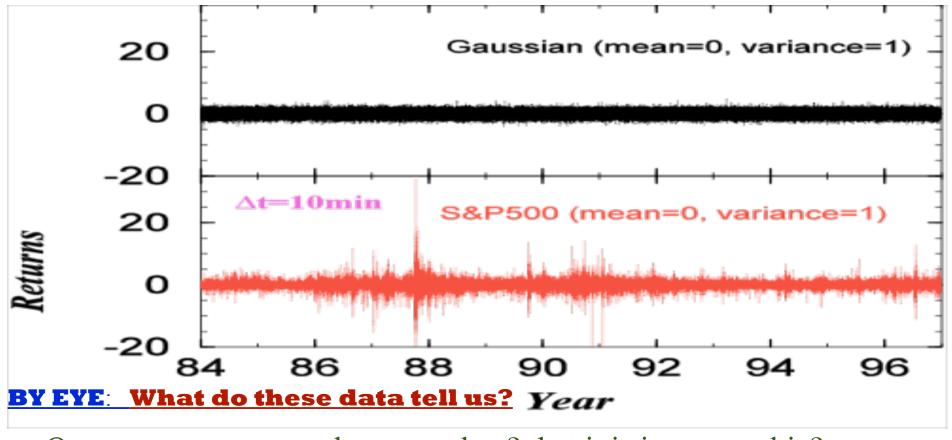
0000



**TEST #1**: if interacting system of subunits, should be "universality"

DATA Show: power-law exponents are Universal (indep of time period, country, volatility (ex 1987,2008,... same!). implies what??





Q: can your **eye** see the power law? that it is inverse cubic?

Returns non-Gaussian (known qualitatively, but under-appreciated!)

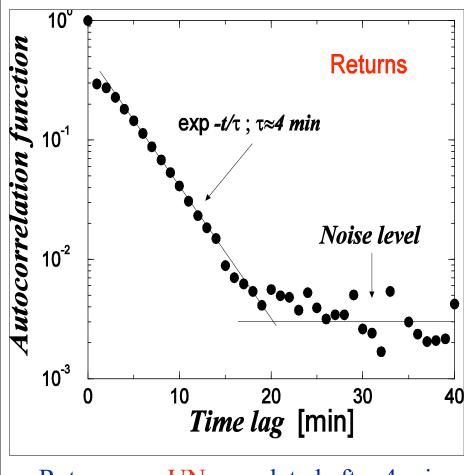
Large events cluster (like earthquakes) (also known qualitatively)

"Aftershocks" Omori-correlated (Palermo 03; BU 07)

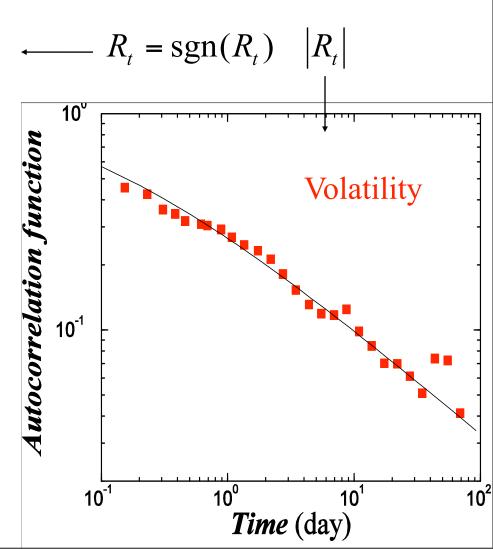
"Aftershocks of each aftershock" also Omori-correlated: (BU)

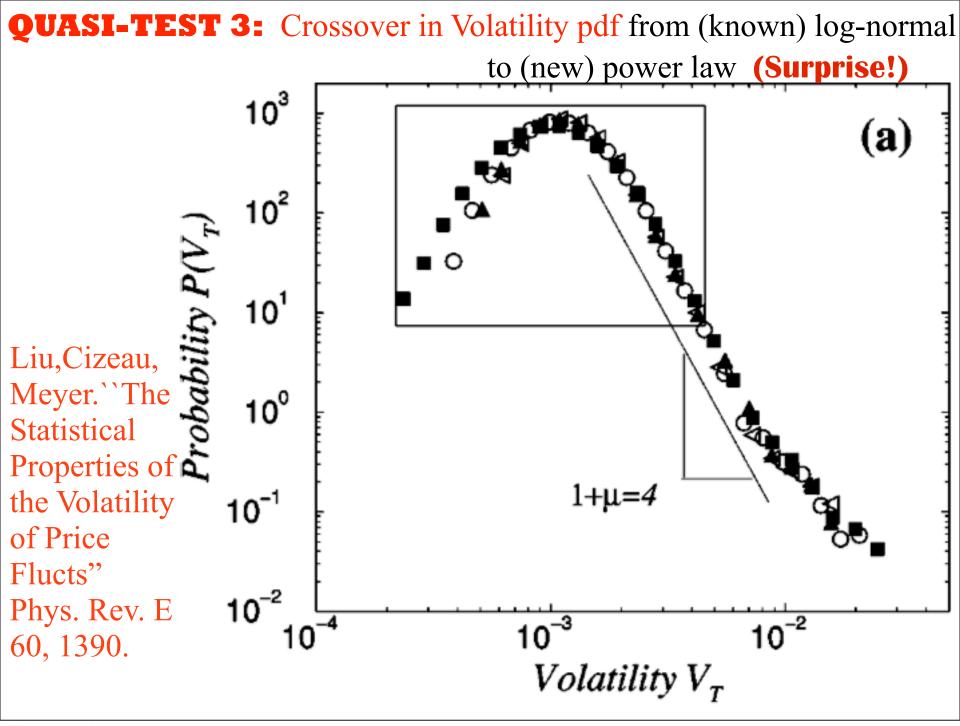
#### **QUASI-TEST 2**: Are there time Correlations?

((economists knew these results, qualitatively, as volatility clustering....so calculate autocorrelation function and get a "law"))



- Returns are UN-correlated after 4 min
- Absolute value of returns (volatility) is long range correlated, so returns CAN NOT BE serially independent.





#### Can a law describe bubbles and crashes in financial markets?

Goal: every trade---msec level...

Tobias Preis 1,2 and H. Eugene Stanley 1

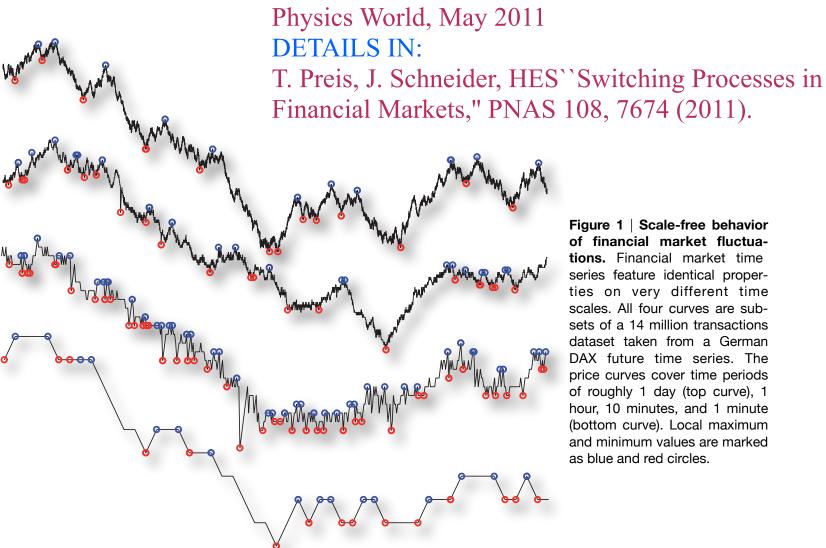


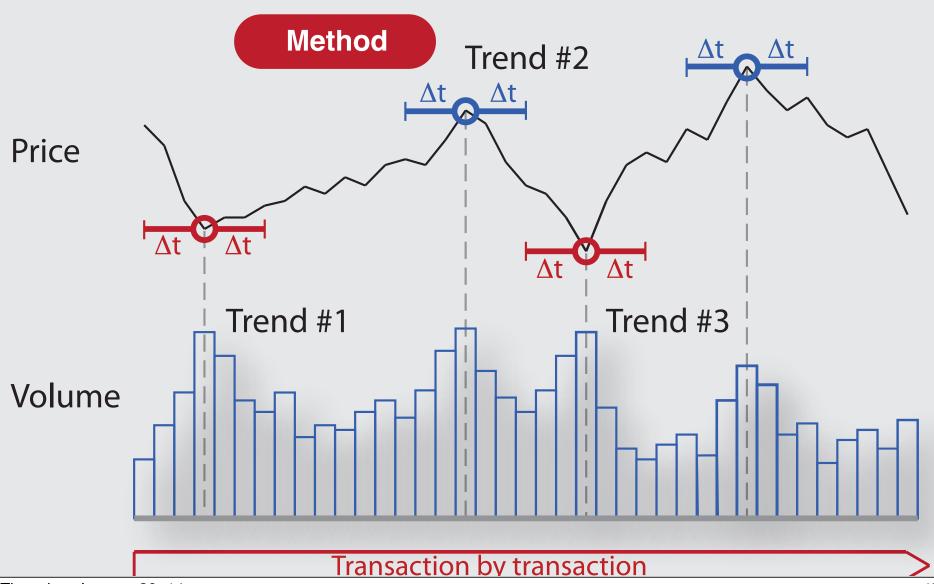
Figure 1 | Scale-free behavior of financial market fluctuations. Financial market time series feature identical properties on very different time scales. All four curves are subsets of a 14 million transactions dataset taken from a German DAX future time series. The price curves cover time periods of roughly 1 day (top curve), 1 hour, 10 minutes, and 1 minute (bottom curve). Local maximum and minimum values are marked as blue and red circles.

#### BIG QUESTION: How to quantify/analyze?????

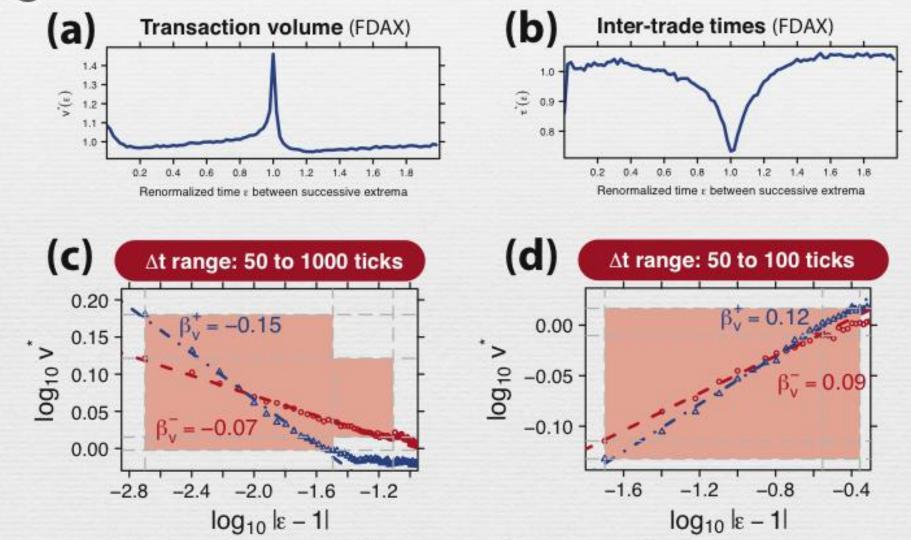
ANS: :: Preis/HES/Schneider (2011 PNAS; May 2011 Physics World)

(b)

**Determination of local price extrema** ( $\Delta t=3$  fixed)



### Quantities With Scale-Free Behavior

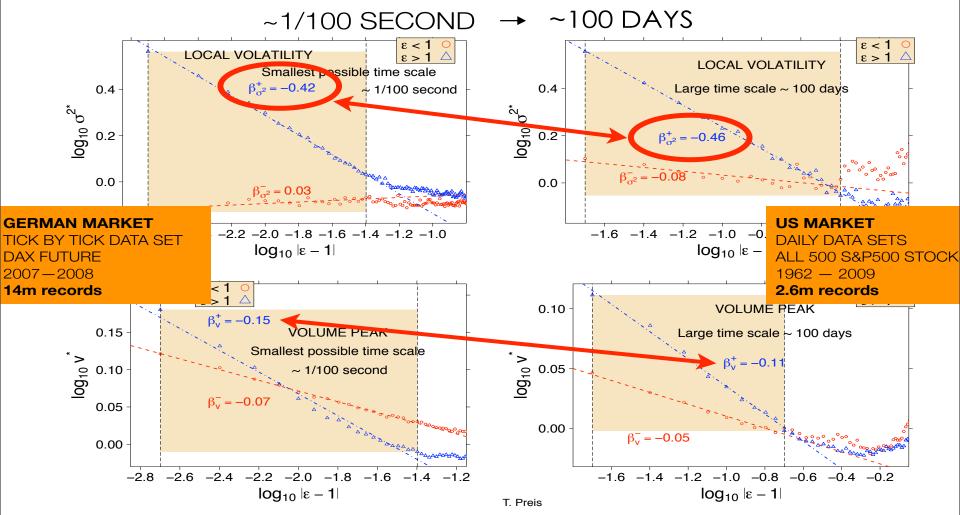


Randomly reshuffling confirms our findings.

Preis/HES/Schneider (2011 PNAS; May 2011 Physics World)

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#### FROM THE VERY SMALL TO THE VERY LARGE

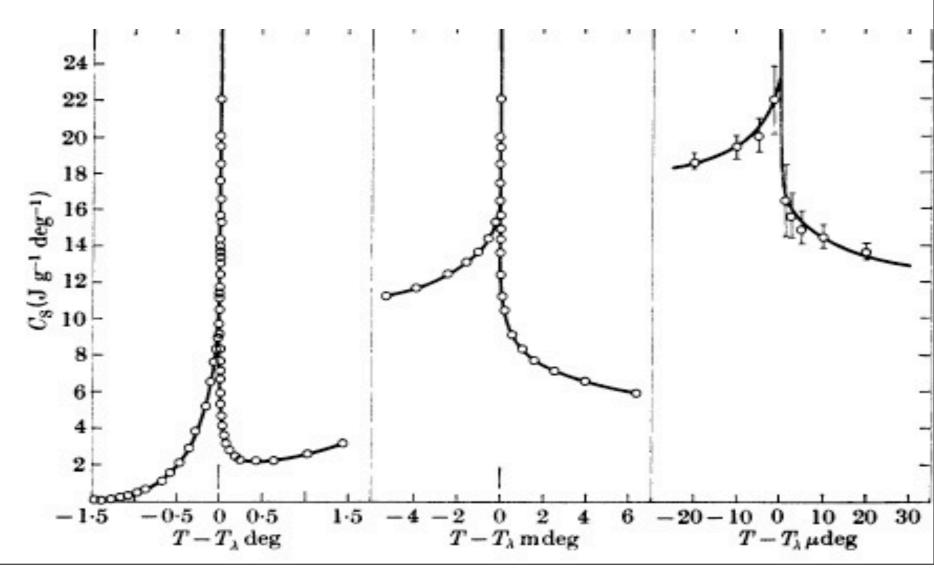


100x60x60x24x100 = 1,000,000,000....9 orders of magnitude!

Preis/HES/Schneider (2011 PNAS, May 2011 Physics World)

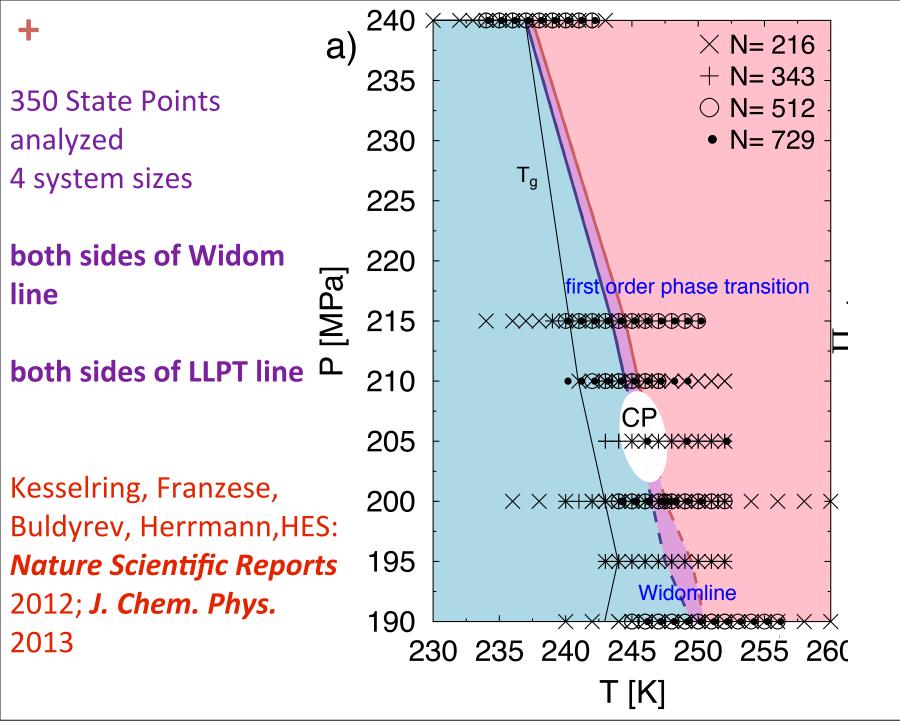
## SCALE FREE SPECIFIC HEAT NEAR HELIUM SWITCH POINT

Note: Same FUNCTION for 3 different scales: 6 orders of magnitude!!!



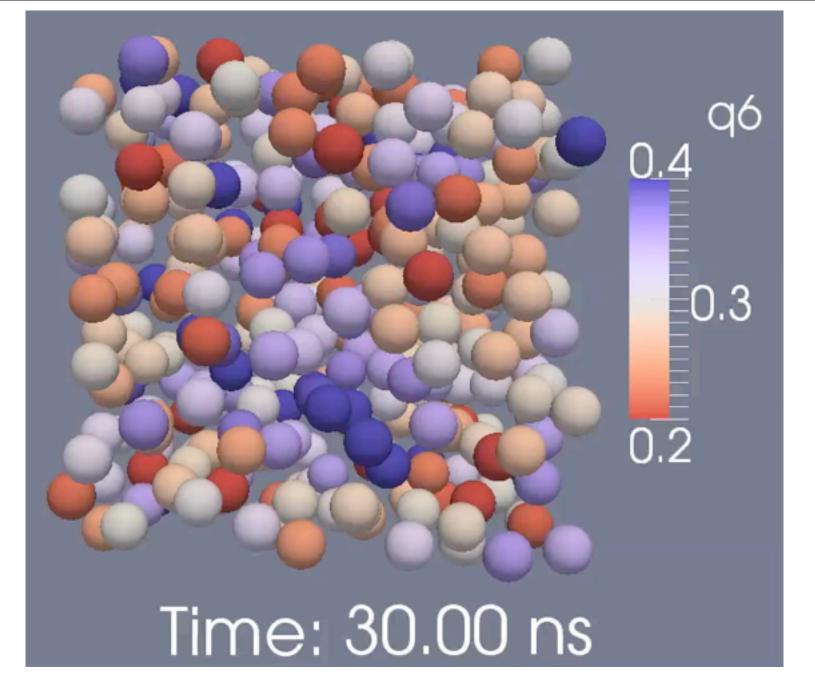












CNN News today:
A "failure cascade" affecting many infrastructure networks:
power, internet, ....

## TWO MINUTES OF TODAY'S CNN NEWS BROADCAST

### NETWORK SCIENCE The science of the 21st century

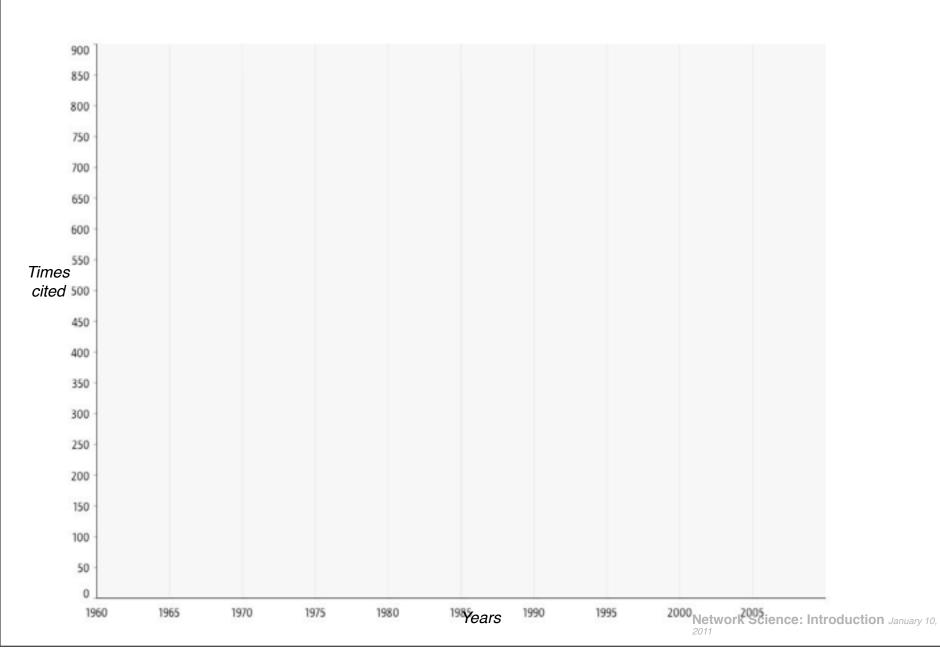
Times cited

Years

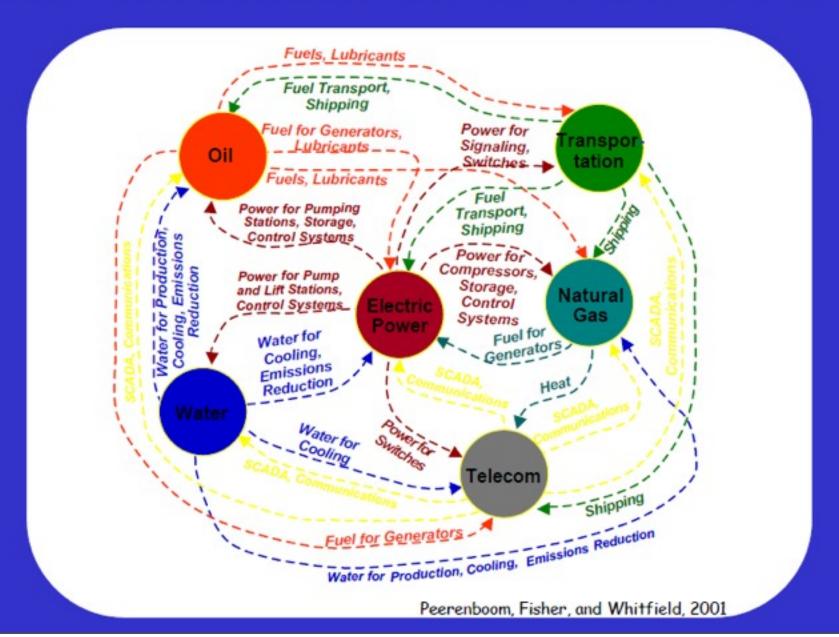
Network Science: Introduction January 10,

#### NETWORK SCIENCE

#### The science of the 21st century



### How interdependent are infrastructures?



#### Critical Breakdown Threshold for 2 Interdependent Networks

Failure in network A causes failure in network B causes further failure in network A .....CASCADES



Network

interdependent networks? What is size of cascade failures?

#### FURTHER EXAMPLES OF INTERDEPENDENT NETWORKS:

- *Economy*: Networks of banks, insurance companies, and firms which interact and depend on each other.
- *Physiology*: The human body is composed of inter-dependent networks (hip!)
- *Biology*: A specific cellular function is performed by a network of interacting proteins, which depend on other networks

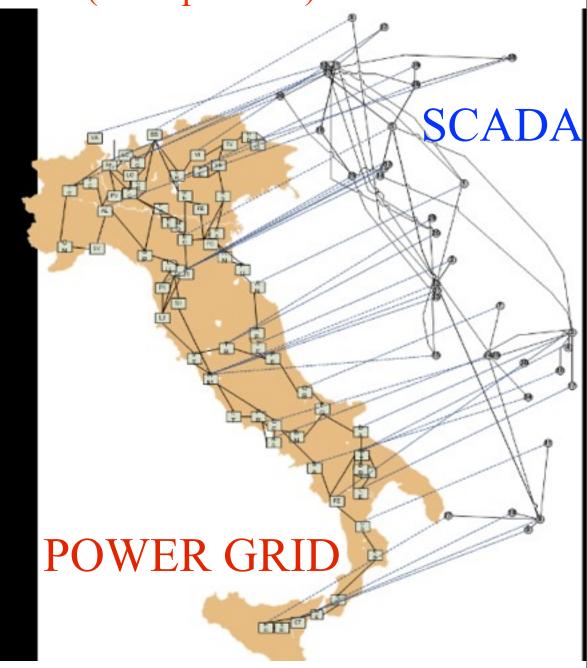
#### Buldyrev, Parshani, Paul, Stanley, Havlin, Nature, 464, 1025 (2010)

#### NATIONWIDE BLACKOUT(28 Sept. 2003)

Thank: Nature referee

27 Sept 2003: 1 DAY BEFORE THE CASCADE OF FAILURES

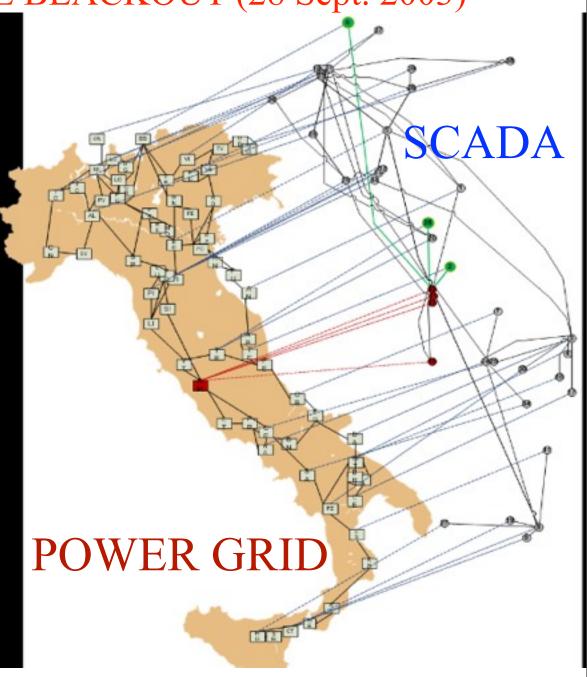
SCADA =
Supervisory
Control And Data
Acquisition



Stage 1: NATIONWIDE BLACKOUT (28 Sept. 2003)

The first second:
ABOVE the critical breakdown threshold [only Rome power is out]

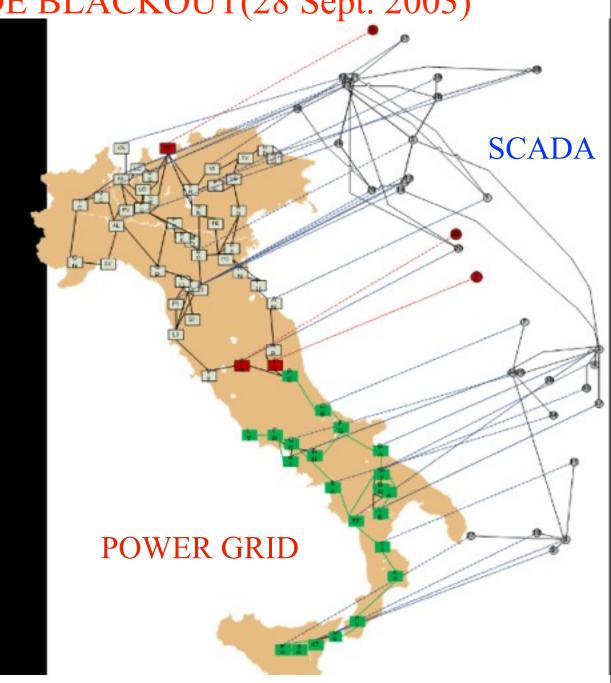
SCADA =
Supervisory Control
AND Data
Acquisition



Stage 2: NATIONWIDE BLACKOUT(28 Sept. 2003)

A few seconds later: STILL ABOVE the critical breakdown threshold

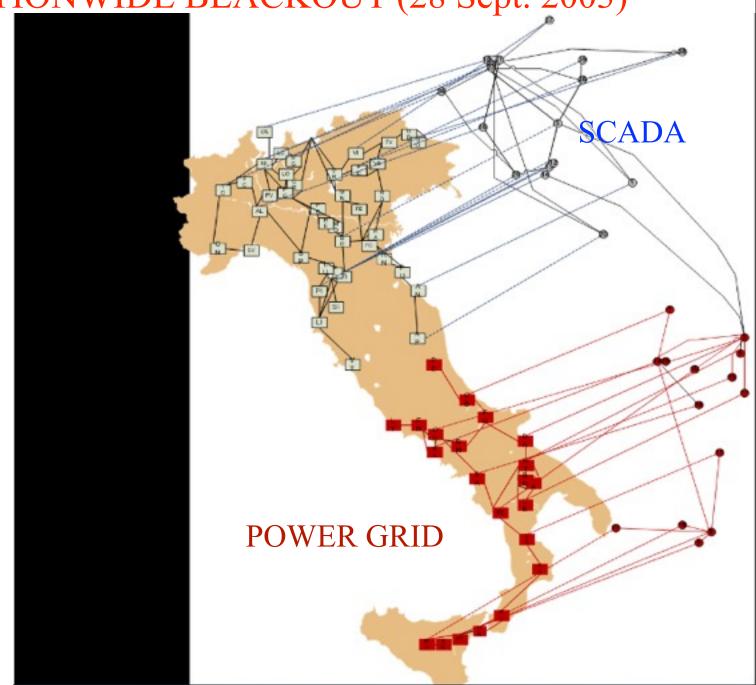
SCADA=Supervisory
Control And Data
Acquisition



Stage 3: NATIONWIDE BLACKOUT (28 Sept. 2003)

A few seconds later still: Now BELOW the critical breakdown threshold!!!

SCADA=
Supervisory
Control And
Data
Acquisition



## Report of the Commission to Assess the Threat to the United States from Electromagnetic Pulse (EMP) Attack

Critical National Infrastructures

2008

"The physical & social fabric of civilized countries is sustained by a System of Systems; a complex and dynamic network of interlocking and interdependent infrastructures (critical national infrastructures) whose harmonious functioning enables the myriad actions, transactions, and information flow that undergird the orderly conduct of civil society in this country. . . ."

". . .the vulnerability of the whole — of all the highly interlocked critical infrastructures — may be greater than the sum of the vulnerability of its parts. . ."

"No currently available modeling and simulation tools exist that can adequately address the consequences of disruptions and failures occurring simultaneously in different critical infrastructures that are dynamically interdependent."

#### 2 INTERDEPENDENT NETWORKS:

- Until 2010\*\*\*, scientists focused on the case of a single network which is isolated AND is not influenced by other networks.
  - \*\*\* Buldyrev et al, Nature, **464**, 1025 (2010); Leicht et al cond-mat)
- •Isolated systems rarely occur in nature nor in technology [ex: non-interacting molecules NEVER occur-otherwise liquids could not exist!].
- Take home message: Results for interacting "interdependent" networks strikingly different from single networks..& different from "chaos theory"

What today's "catastrophic failure" is NOT:

# Chaos theory & systemic breakdown: 700 year old paradigm (ancestor of "Beijing butterfly" paradigm) For Want of a Nail

For want of a nail the shoe was lost.

For want of a shoe the horse was lost.

For want of a horse the rider was lost.

For want of a rider the battle was lost.

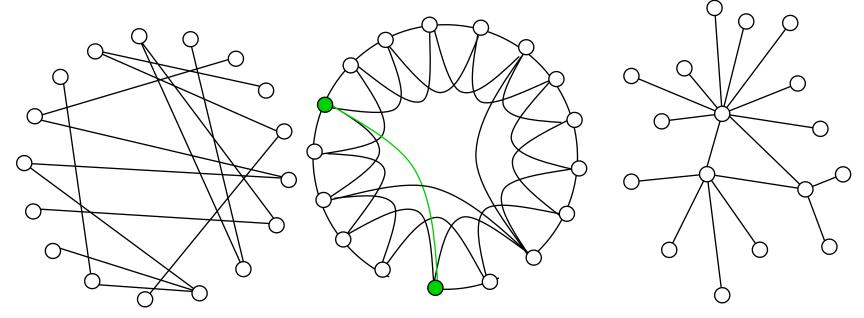
For want of a battle the kingdom was lost.

And all for the want of a horseshoe nail.

#### **PROBLEM**:

p x p x p x p x p = 1/1,000,000,000,000,000 (very tiny)

## 3 types of networks...



Erdös-Rényi (Exponential tail)

Adv: solvable

Disadv: not realistic

Watts-Strogatz ("re-wire")

Adv: Small world

Disadv: not realistic

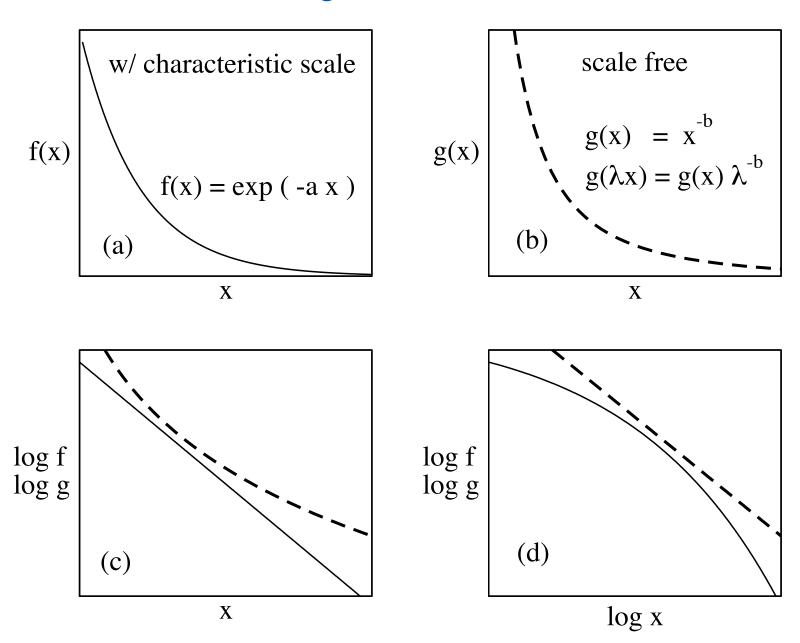
Scale-free (Power law tail)

Adv: more realistic

Disadv: not solvable

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#### "Dummies Guide" to Discovering if a network is scale free:

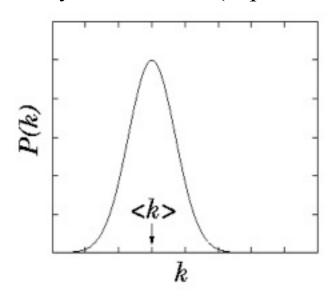


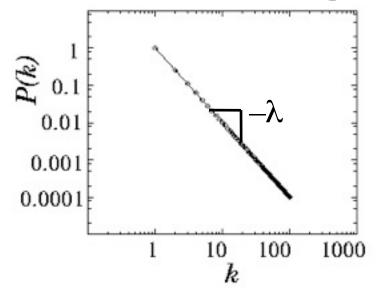
## How to quantify? Number of nodes of degree *k* [new]

Courtesy: Barabasi 1999 plane

Erdos-Renyi distribution (exponential tail)

Scale-free distribution (power law tail)





#### **Exponential Tail**

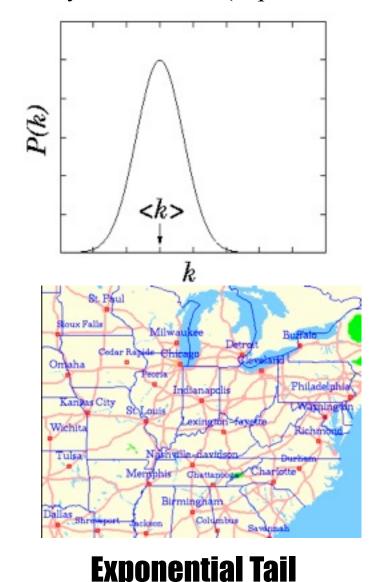
## **Power Law Tail**

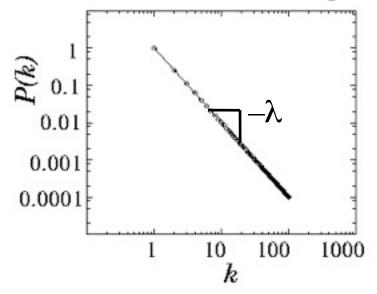
## How to quantify? Number of nodes of degree *k* [new]

Courtesy: Barabasi 1999 plane

Erdos-Renyi distribution (exponential tail)







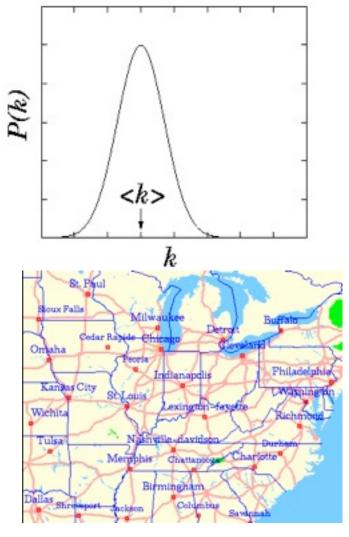
Power Law Tail

## How to quantify? Number of nodes of degree *k* [new]

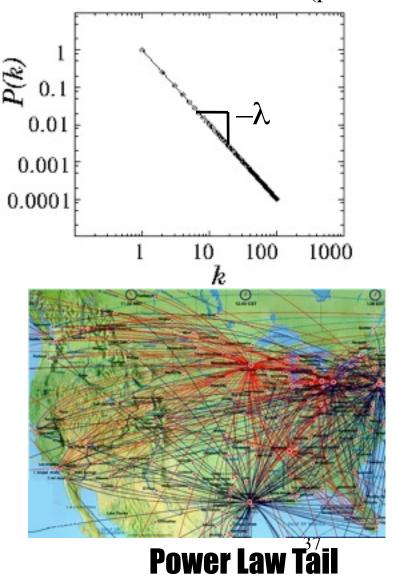
Courtesy: Barabasi 1999 plane

Erdos-Renyi distribution (exponential tail)

Scale-free distribution (power law tail)



**Exponential Tail** 



## Question:

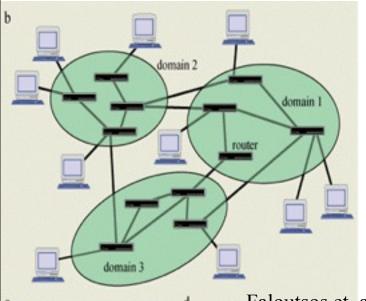
## To which class belongs the airline network?

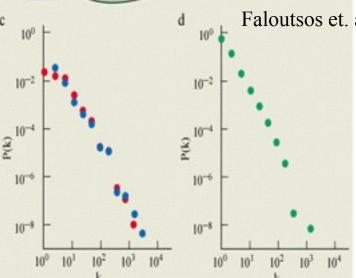
(CLUE: Hubs & Spokes)

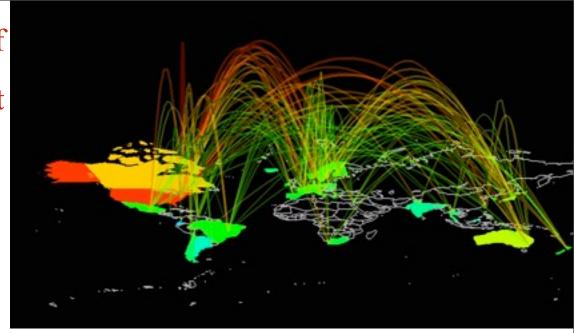


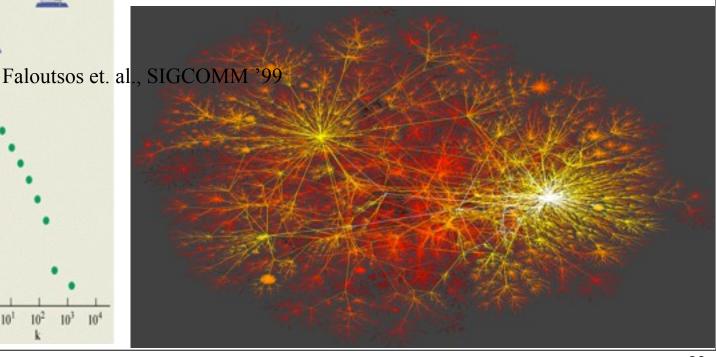
## Real world example of

scale-free networks: Internet







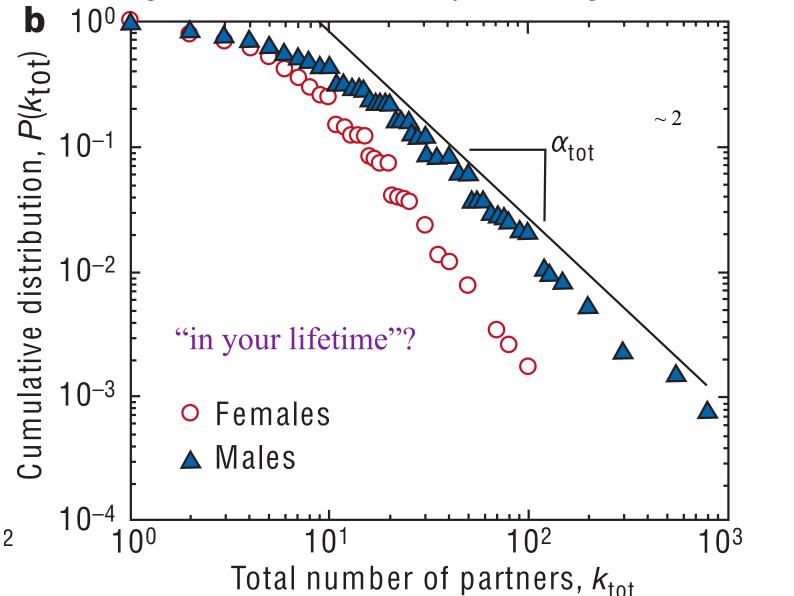


F. Liljeros, C. R. Edling, L. A. N. Amaral, H. E. Stanley, and Y. Aberg, "The Web of Contacts," Nature 411, 907-908 (2001).[Citations: 851]

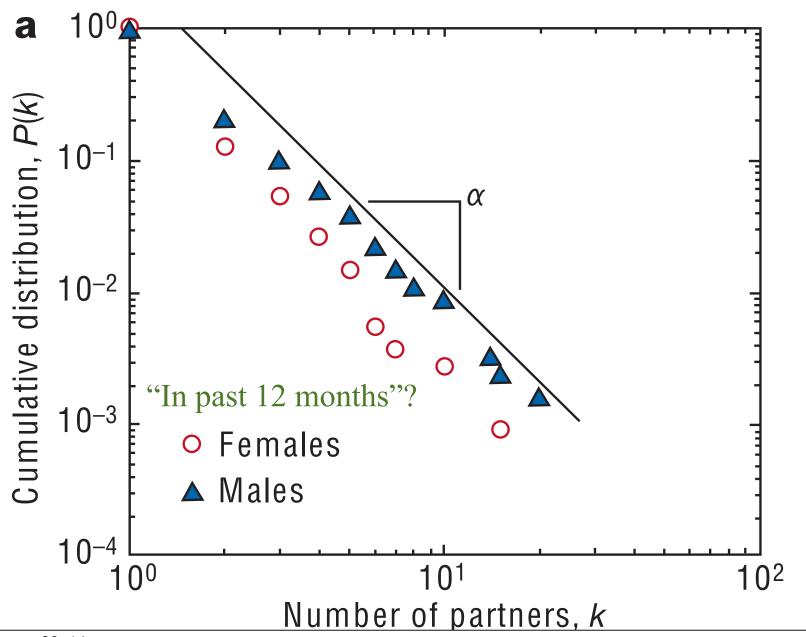
nlike clearly defined 'real-world' networks<sup>1</sup>, social networks tend to be subjective to some extent<sup>2,3</sup> because the perception of what constitutes a social link may differ between individuals. One unambiguous type of connection, however, Human Sexual is sexual contact, and here we analyse the sexual behaviour of a random sample of individuals<sup>4</sup> to reveal the mathematical features of a sexual-contact network. We find that the cumulative distribution of the number of different sexual partners in one year decays as a scale-free power law that has a similar exponent for males and females. The scale-free nature of the web of human sexual contacts indicates that strategic safe-sex campaigns are likely to be the most efficient way to prevent the spread of sexually transmitted diseases.

#### Q1: A "LAW" OF HUMAN BEHAVIOR? Q2: WHY CARE?

F. Liljeros, C. R. Edling, L. A. N. Amaral, H. E. Stanley, and Y. Aberg, Nature **411** (2001).



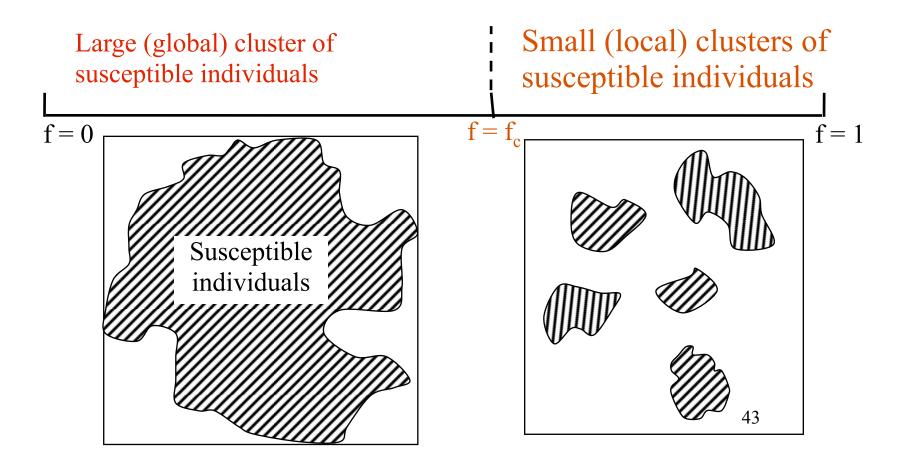
## Worry: Artifact of "scale-free imagination"???



### EXAMPLE: Network Immunization Strategies

#### REQUIREMENTS of an efficient immunization strategy:

- Immunize at least a critical fraction  $f_c$  ("Immunization threshold") of the number of individuals so that only isolated clusters of susceptible individuals remain.
- Effective without detailed knowledge of the network.



## Three immunization strategies

Example: Immunize 2 of the 9 nodes in a scale-free network

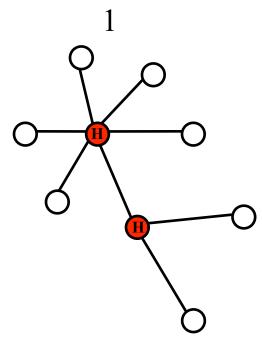
Question: What is chance to stop the spread?

#### Random:

2/9  $\bigcirc$  Hubs

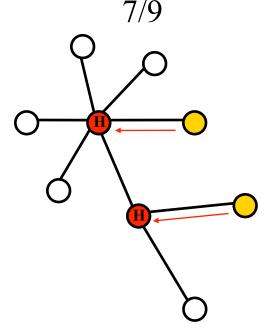
- High immunization threshold
- No prior network information needed

#### **Targeted:**



- Low immunization threshold
- Need to know hubs (highly No prior network connected individuals)

#### **Acquaintance:**



- Low immunization threshold
- information needed

Real world example: Stopping spread of heresy in Middle Ages

Ormerod/Roach -- The medieval inquisition: scale-free networks & the suppression of heresy

Real world example: Stopping spread of heresy in Middle Ages Ormerod/Roach -- "The medieval inquisition: scale-free networks & the suppression of heresy"

Knowing from the confessions of these Catholics that they were mixed up with heretics, [the crusaders] said to the abbot.

'What shall we do, lord? We cannot tell the good from the bad.

The abbot, .....is said to have said: "Kill them. For God knows

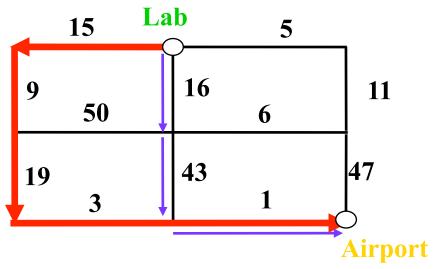
This singling out of guides and messengers, the contacts of the key heretics, rather than the heretics (*perfecti*) themselves is now known as 'acquaintance immunisation.' It is usually more efficient to inoculate one of the contacts of a node rather than the node itself [17].

who are his." Thus innumerable persons were killed in that city.

R. Cohen et al. "Efficient Immunization Strategies for Computer Networks and Populations," Phys. Rev. Lett. **91**, 247901 (2003).

## Optimal Path: Minimize total "cost"

L. A. Braunstein, S. V. Buldyrev, R. Cohen, S. Havlin, and H. E. Stanley, "Optimal Paths in Disordered Complex Networks" Phys. Rev. Lett. {\bf 91}, 168701.



#### For this example:

Shortest path: 3 (cost = 60)

Optimal path: 5 (cost = 47)

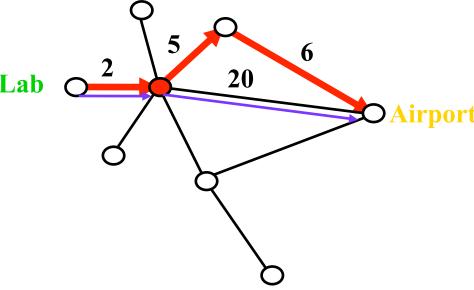
#### **Generally:**

Shortest path =  $N^{0.50}$ 

Optimal path =  $N^{0.61}$ 

 $N^{0.50} < N^{0.61}$ 

**ex**:  $(10^6)^{0.50} < (10^6)^{0.61}$ 



Shortest path: 2 (cost = 22)

Optimal path: 3 (cost = 13)

Shortest path = Log N

Optimal path =  $N^{1/3}$ 

 $Log N << N^{1/3}$ 

ex:  $N=10^6$ ,  $\log 10^6 \le (10^6)^{1/3}$ 

VOLUME 279 NUMBER 73 Suggested retail price \$1.00 83.50 outside of Metro Boston

## The Boston Globe

MONDAY, MARCH 14, 2011

A NEW WEAK

Tooax: Partly sunny and colder. H 37-42. Low 27-32. Toxonnow: Mostly sunny, milde

High 42-47. Low 32-37. Hoor Time: 6:42 a.m., 7:25 p.m.

SUNIME: 6:59 SUNIET: 6:49

FULL REPORT: PAGE B13

## Cascading disaster in Japan



#### Blast shakes a second reactor death toll soar

By Martin Fackler and Mark McDonald

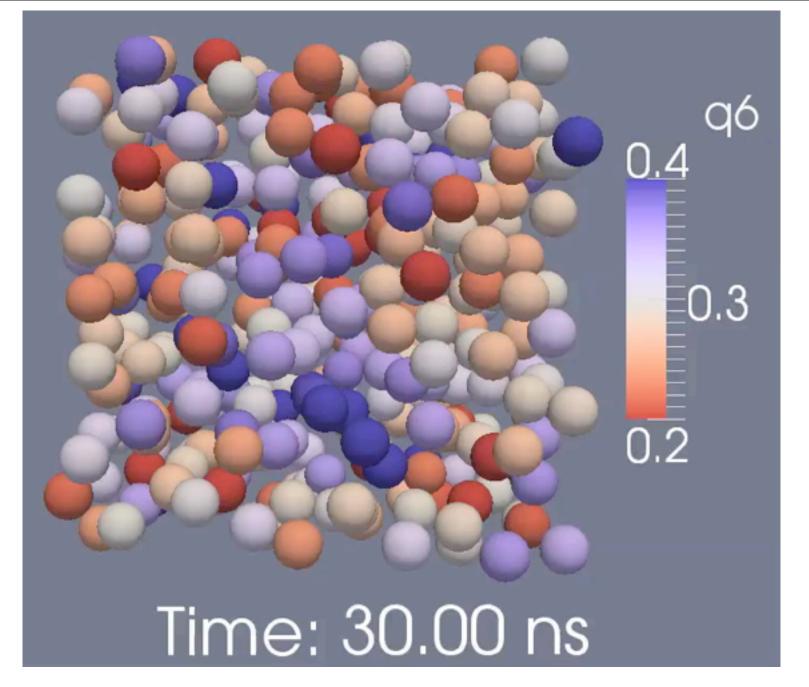
SENDAI, Japan — Japan reel from a rapidly unfolding disaster epic scale yesterday, pummeled by t death toll, destruction, and homele ness caused by the earthquake a tsunami and new hazards from da aged nuclear reactors. The prime m ister called it Japan's worst crisis six World War II.

Japan's \$5 trillion economy, t world's third largest, was threaten with severe disruptions and partial; ralysis as many industries shut do temporarily. The armed forces and v unteers mobilized for the far more gent crisis of finding survivors, evaating residents near the strick power plants and caring for the v tims of the record 8.9 magnitu quake that struck on Friday.

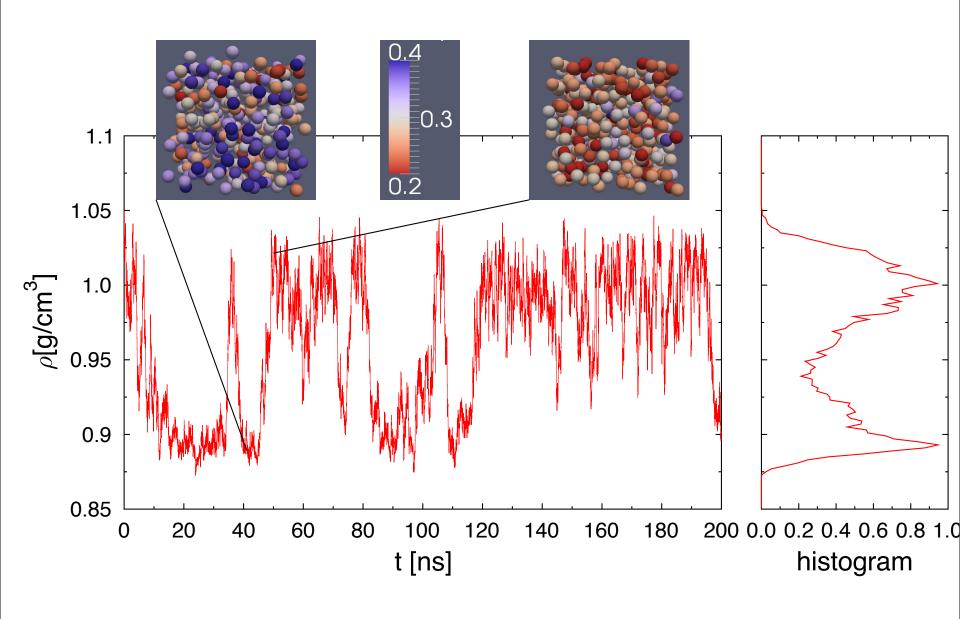
The disaster has left more th 10,000 dead, many thousands hon less, and millions without water, pc er, heat, or transportation.

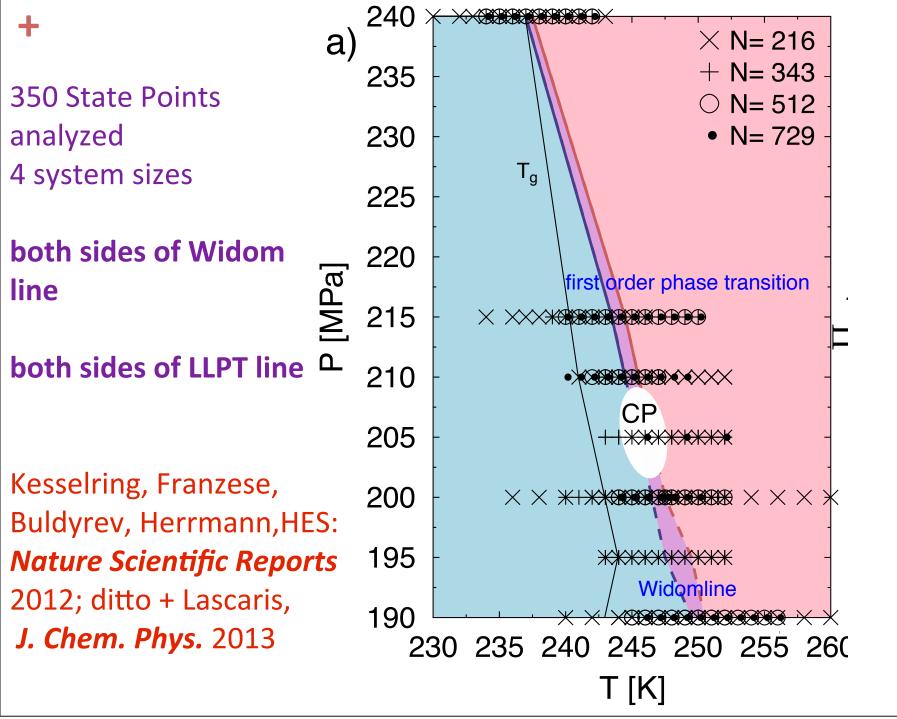






#### water: time dep. for 1 state point near ph. trans. line:





Thursday, January 30, 14 50

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# Did Ehrenfest contribute to economics?

## YES, says Jan Tinbergen!

Between 1921 and 1925, Tinbergen studied <u>mathematics</u> and <u>physics</u> at the <u>University of Leiden</u> under <u>Paul Ehrenfest</u>. During those years at Leiden he had numerous discussions with Ehrenfest, <u>Kamerlingh Onnes</u>, <u>Hendrik Lorentz</u>, <u>Pieter Zeeman</u>, and Albert Einstein.

In 1929 he defended his PhD thesis titled "Minimumproblemen in de natuurkunde en de economie" (Minimisation problems in Physics and Economics). This topic was suggested by Ehrenfest and allowed Tinbergen to combine his interests in mathematics, physics, economics and politics. Diego Garlaschelli biðsketch