

# The complexity of cellular networks

Warning: Statistical physics.  
It only works on average.

<http://regan.med.harvard.edu/CVBR-course.php>

# 2. Dynamics on Complex Networks

- What do networks do? -

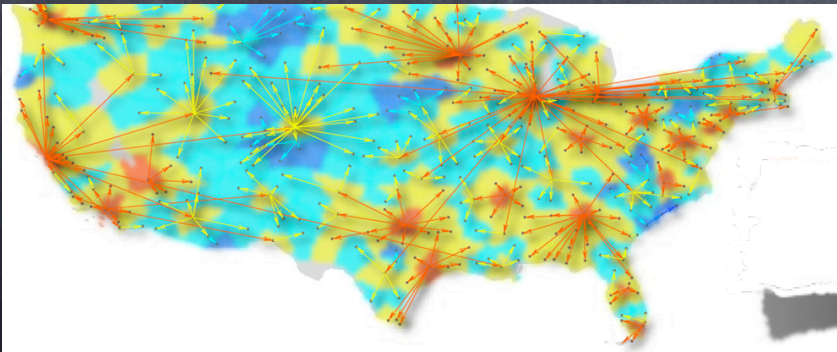
**They CONNECT their nodes.**

**WHY?**

**Communication**

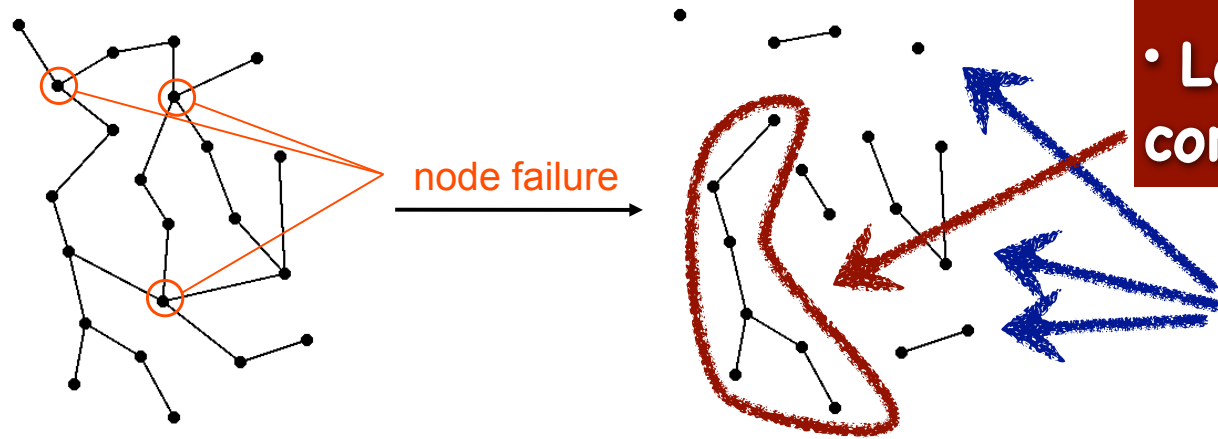
**Traffic**

**Spreading processes**



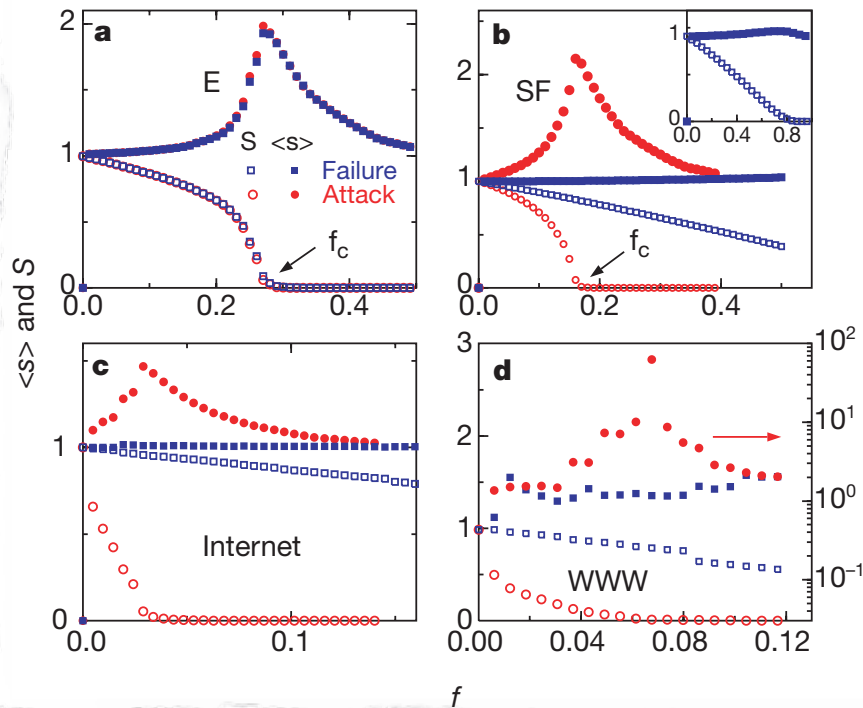
# - Robustness and Vulnerability -

Albert & Barabási, 2000 : the Achilles Heel of the Internet

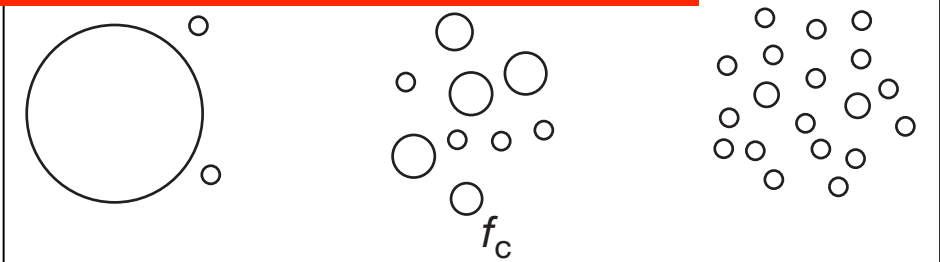


• Largest connected component

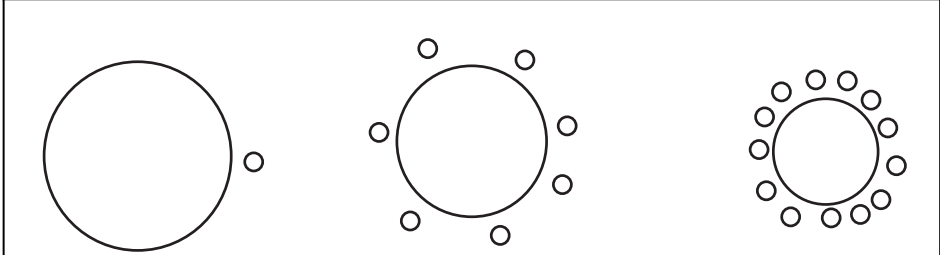
• Average fragment size



Attack on Scale-free network

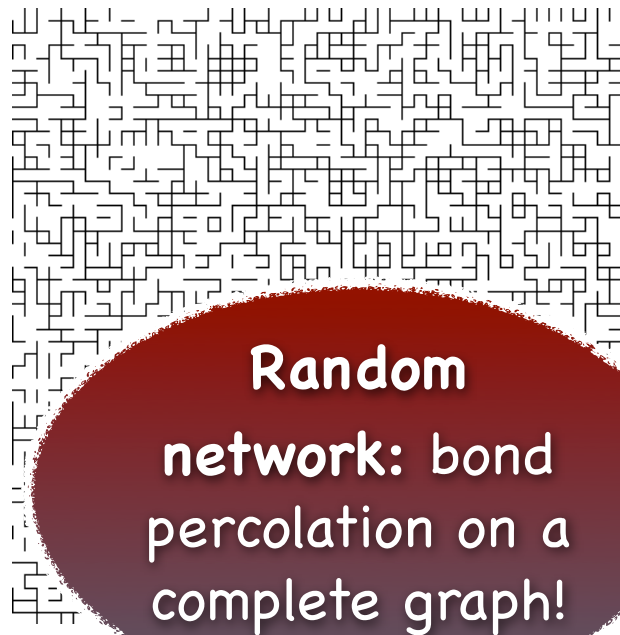


Failure on Scale-free network

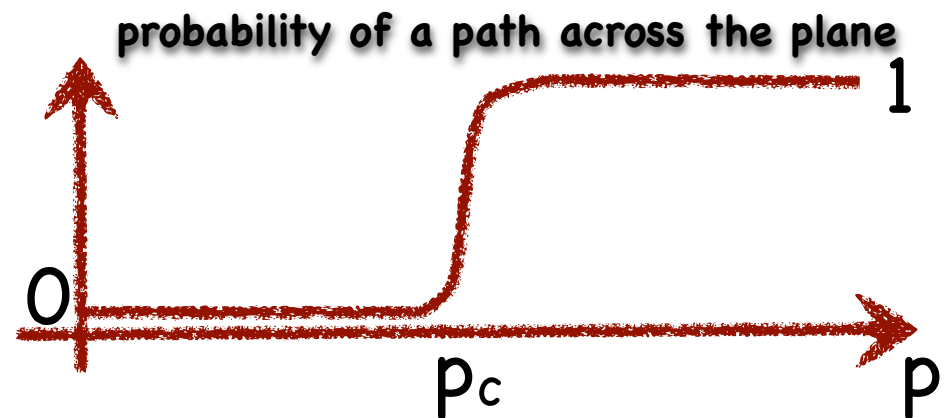


- Statistical physics loves these models! -

- **random failure scenarios map to percolation problems**



- $p$  - probability of a link (node) being "open"
- phase transition between subcritical and supercritical states



➔ percolation threshold in scale-free networks is at  $p_c = 0$

- **assortative networks**

➔ more resilient to random failure

➔ more vulnerable to attack

- Cascading failures -

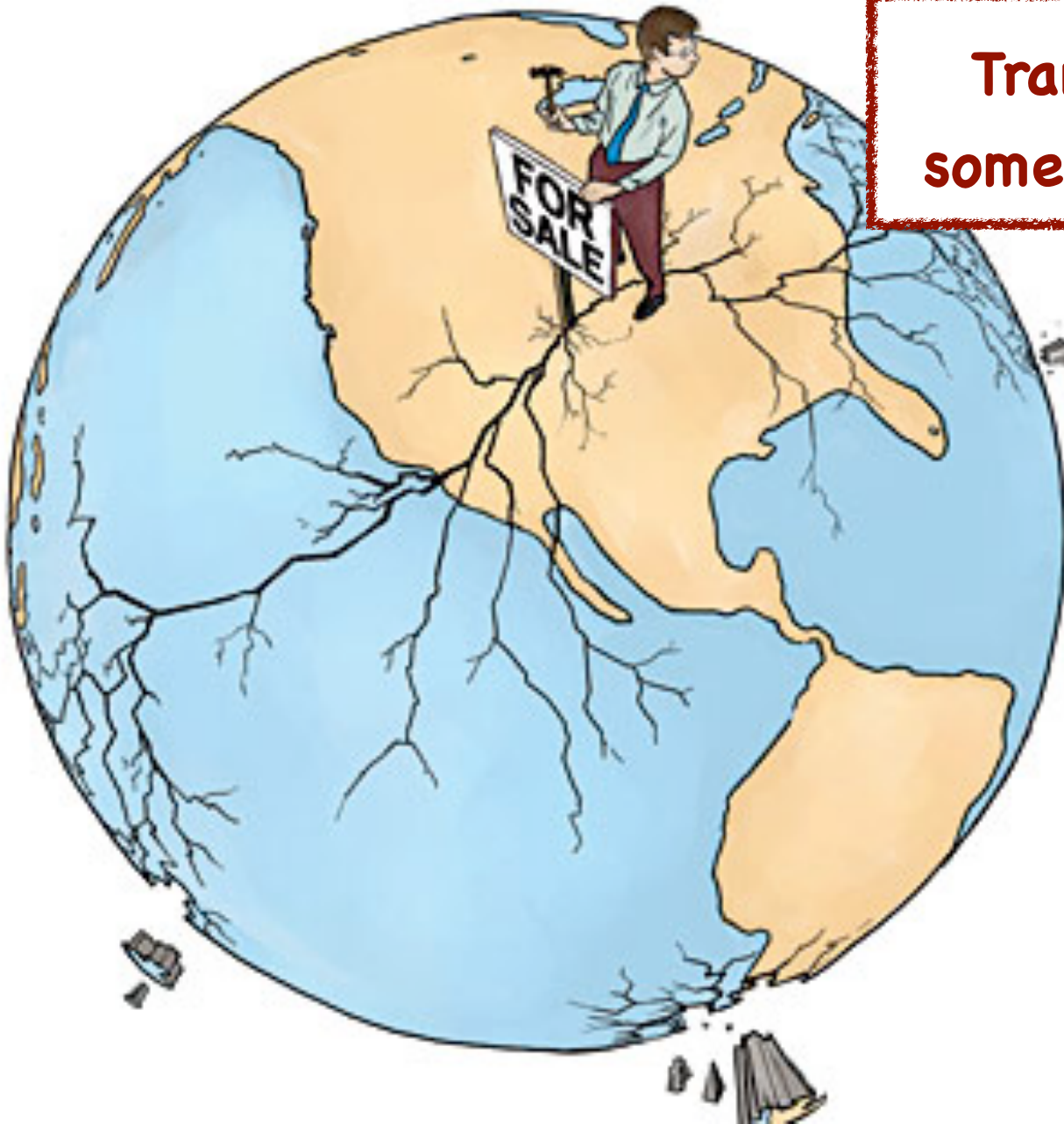
**Transmission (flow) of  
some conserved quantity**

**(Money)**

**Electric power**

**Metabolite mass**

**Information  
packets**



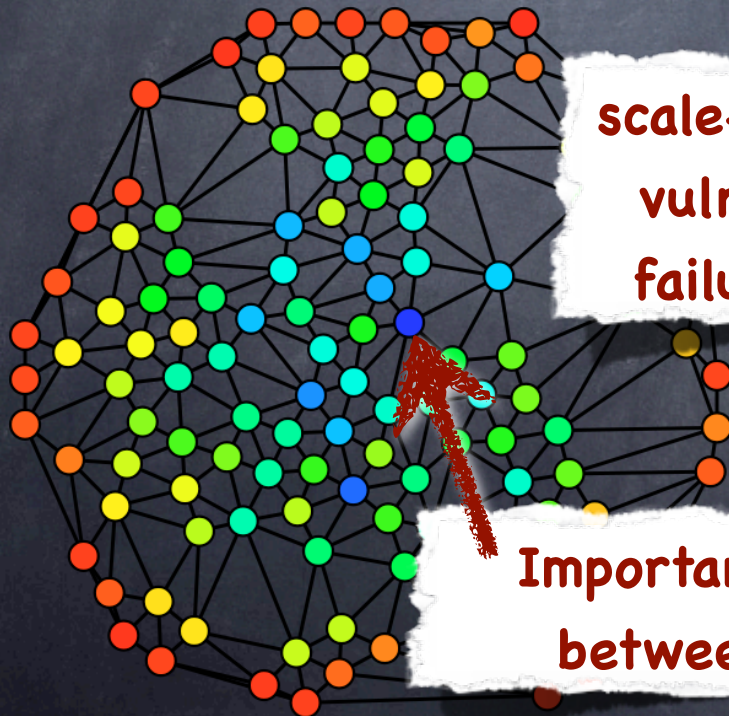
# - Cascading failures -

**Reason: when a node fails, it stops doing its share. Neighbours become overworked.**



Motter and Lai, 2002:

- load bearing capacity  $\sim$  betweenness
- every pair of nodes exchanges 1 packet / timestep



**scale-free networks MORE vulnerable to cascading failure of random nodes**

**Importance of largest betweenness nodes!**



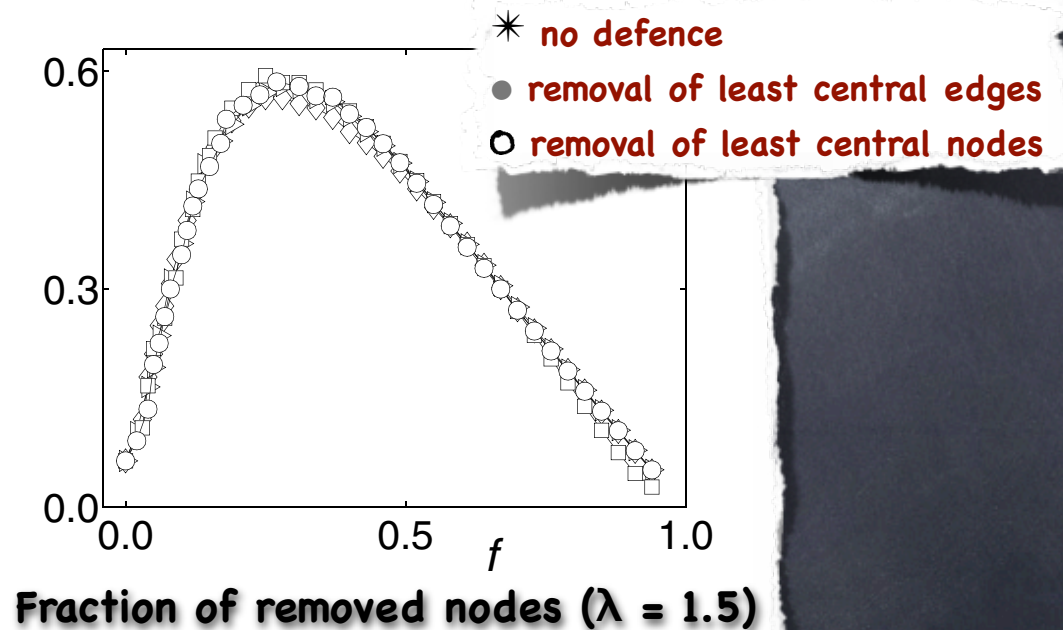
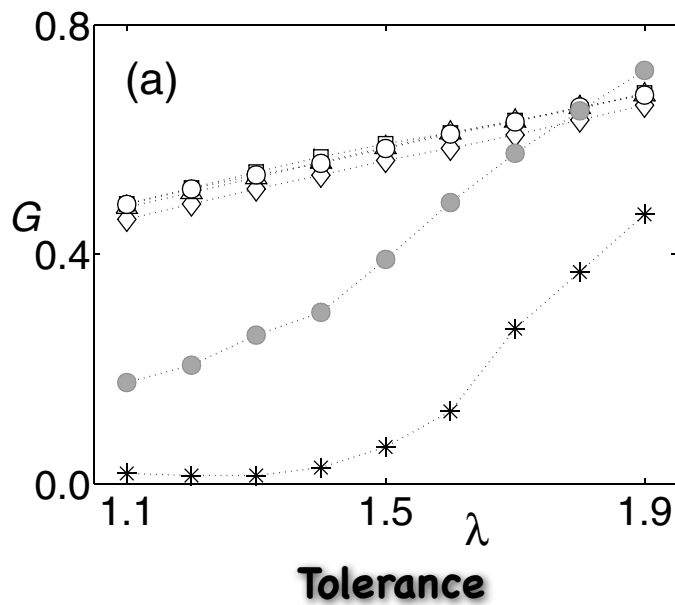
# - A surprising quick-fix -

Motter, 2004:

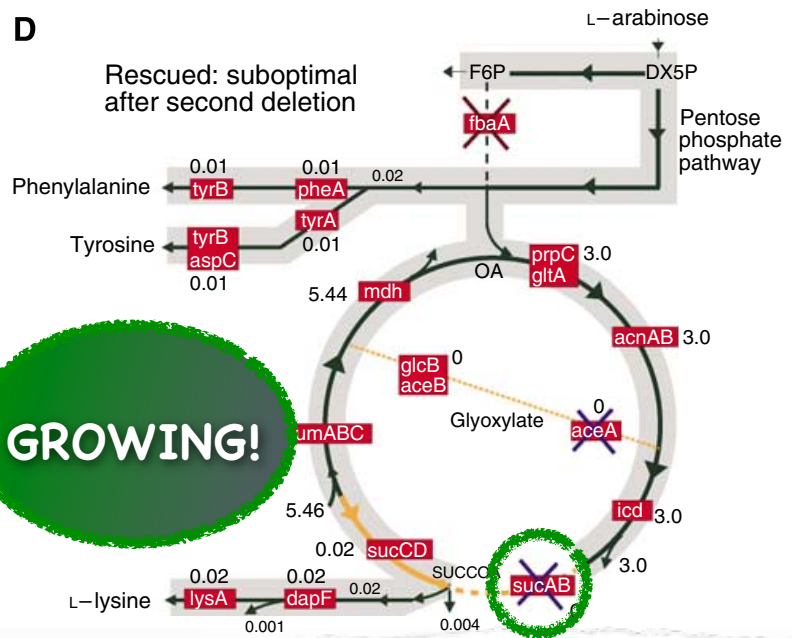
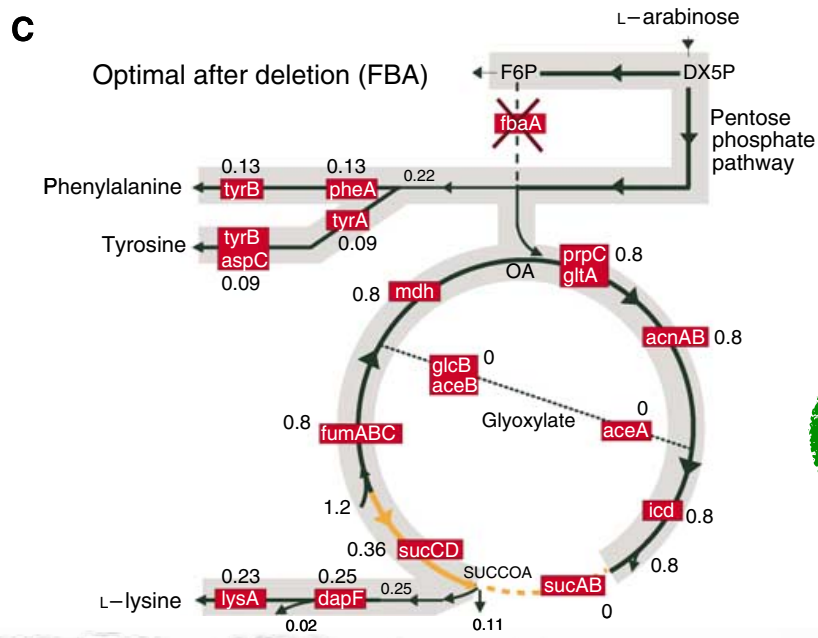
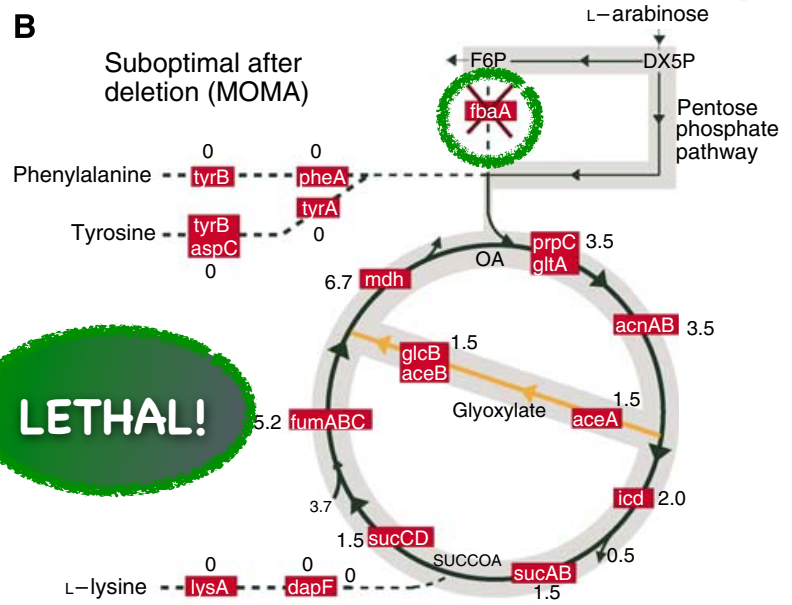
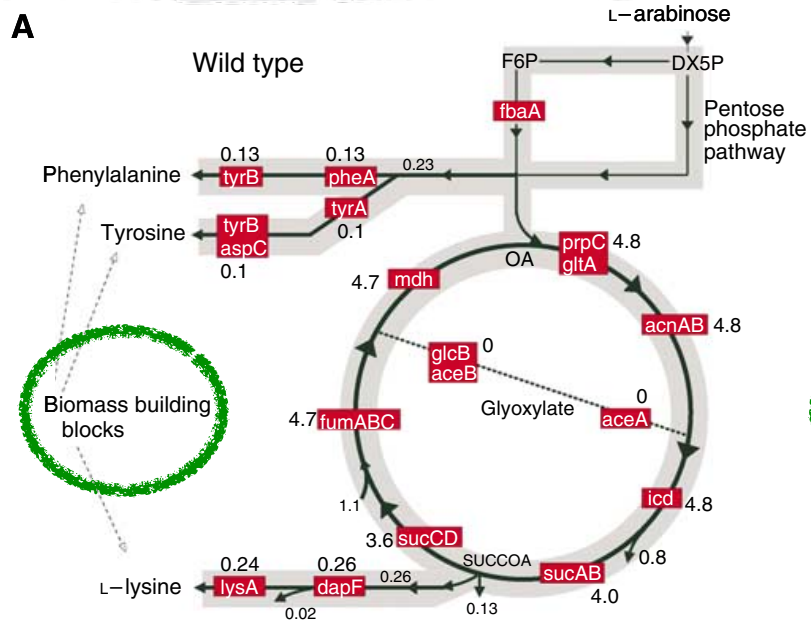
**REMOVE / DISCONNECT nodes that carry small amounts of load:**

- then generate more load than they carry
- their paths to the system are large -> burden many intermediary nodes

Inverse spread of avalanche  
( $N_I/N_F$ )



# - Predicted to work in E.coli's TCA cycle! -

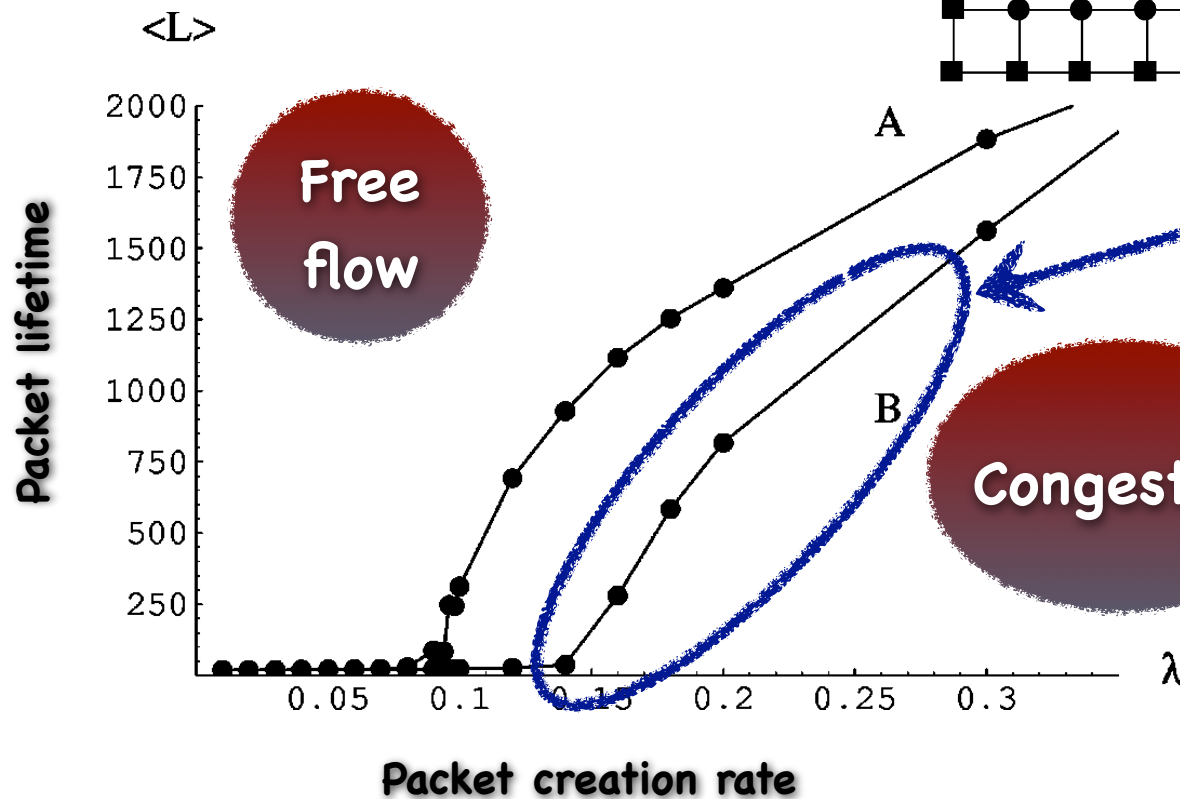
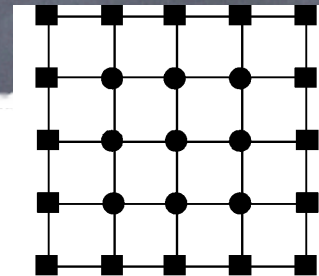




# - Congestion -

Ohira and Sawatari, 1998:

- 2D lattice
- packets (cars) start at boundary
- nodes have unlimited queue (no cascades)
- shortest route
- probabilistic routing



Optimal  
amount of  
randomness in  
choosing  
alternate,  
longer routes

- Physicists love these models! -

- **Influence of network topology:**

- ➔ Zhao et al, 2005: random & scale-free networks are less congested than lattices IF processing capacity  $\sim$  degree

- ➔ SAME congestion threshold on all networks if processing capacity  $\sim$  **betweenness**

- ➔ Toroczkai and Bassler, 2004: **gradient aware flow.**

- ➔ Congestion factor (% of nodes with no incoming traffic) grows with system size in random networks

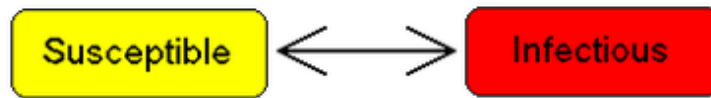
- ➔ it is constant in scale-free networks  $\rightarrow$  scalable!

- **The "Shannon limit" of networks:**

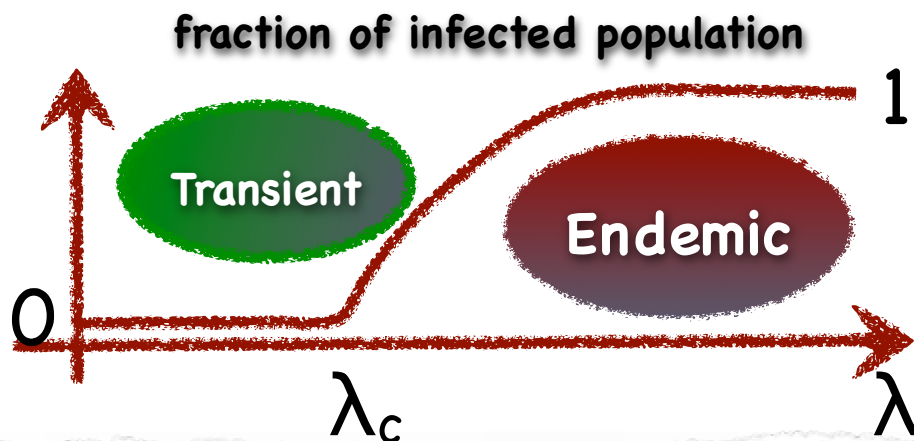
- ➔ Sreenivasan and Toroczkai, 2007: for every physical network there exists a communication threshold that is entirely structural. No routing protocol can do better.

# - Spreading Processes -

SIS model in epidemiology:



- effective spreading rate  $\lambda$

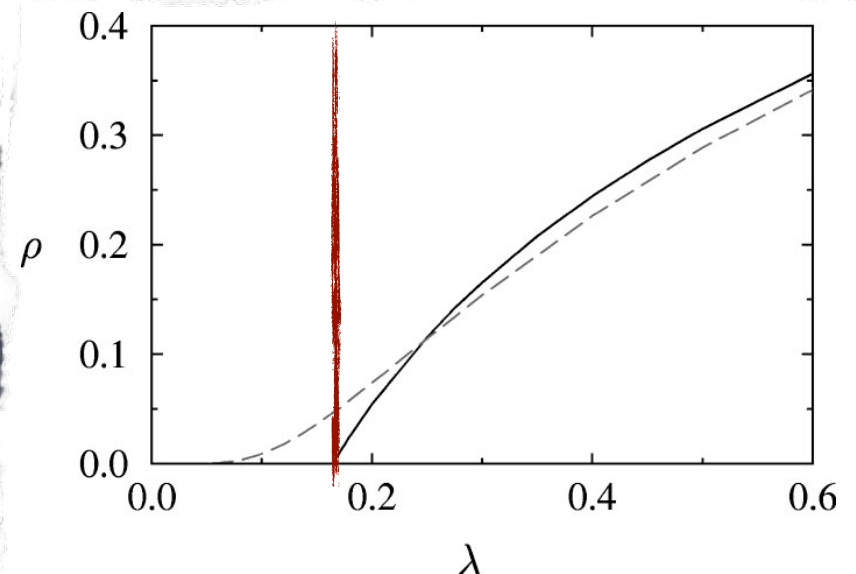


Parrot-Satorras and Vespignani, 2001

**SIR model: SIMILAR RESULT!**

Homogeneous mixing

Spreading on networks

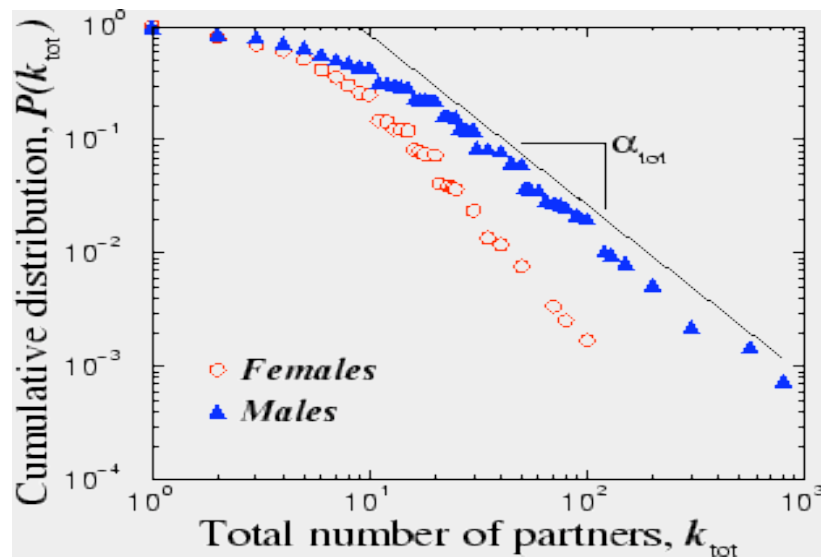


# - So... how do we immunize? -

Dezsó and Barabási; Satorras and Vespignani, 2001

- **Scale-free networks DO NOT respond to random immunization!**

- ➔ random immunization does not restore the threshold
- ➔ need to target the hubs



4781 Swedes; 18-74;  
59% response rate.

Similar to  
failure (random  
event) vs. attack!

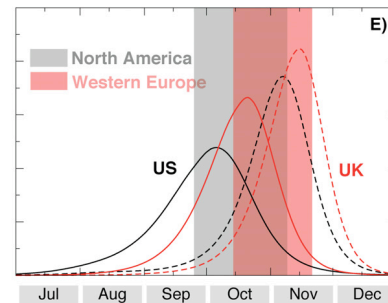
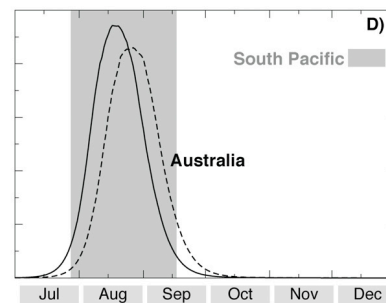
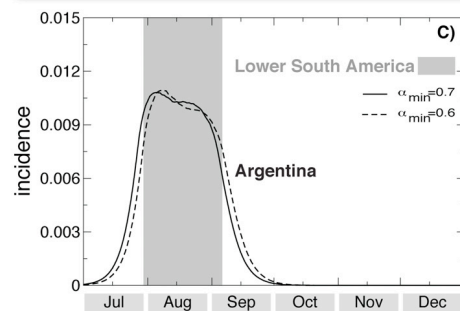
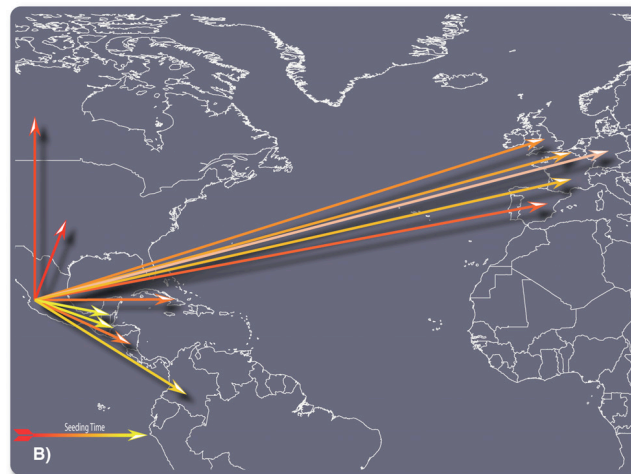
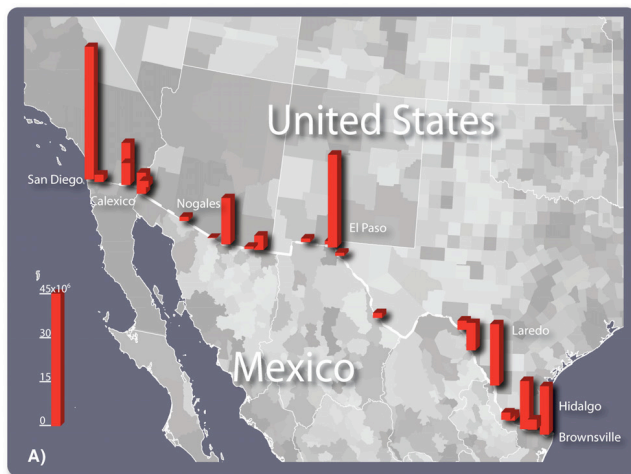
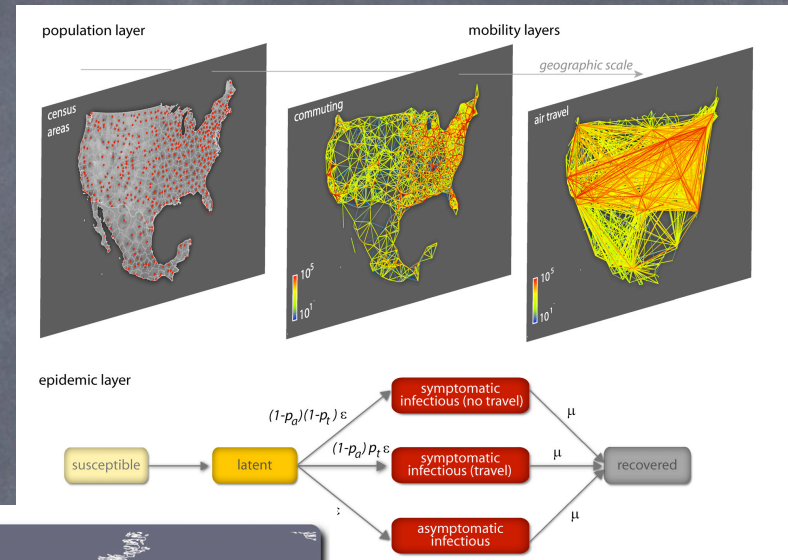
- **possible policy:** choose random individual, ask them to name a friend!

Liljeros et al. Nature 2001

- Would you like it more realistic? -

Vespignani and Colizza, July 2009

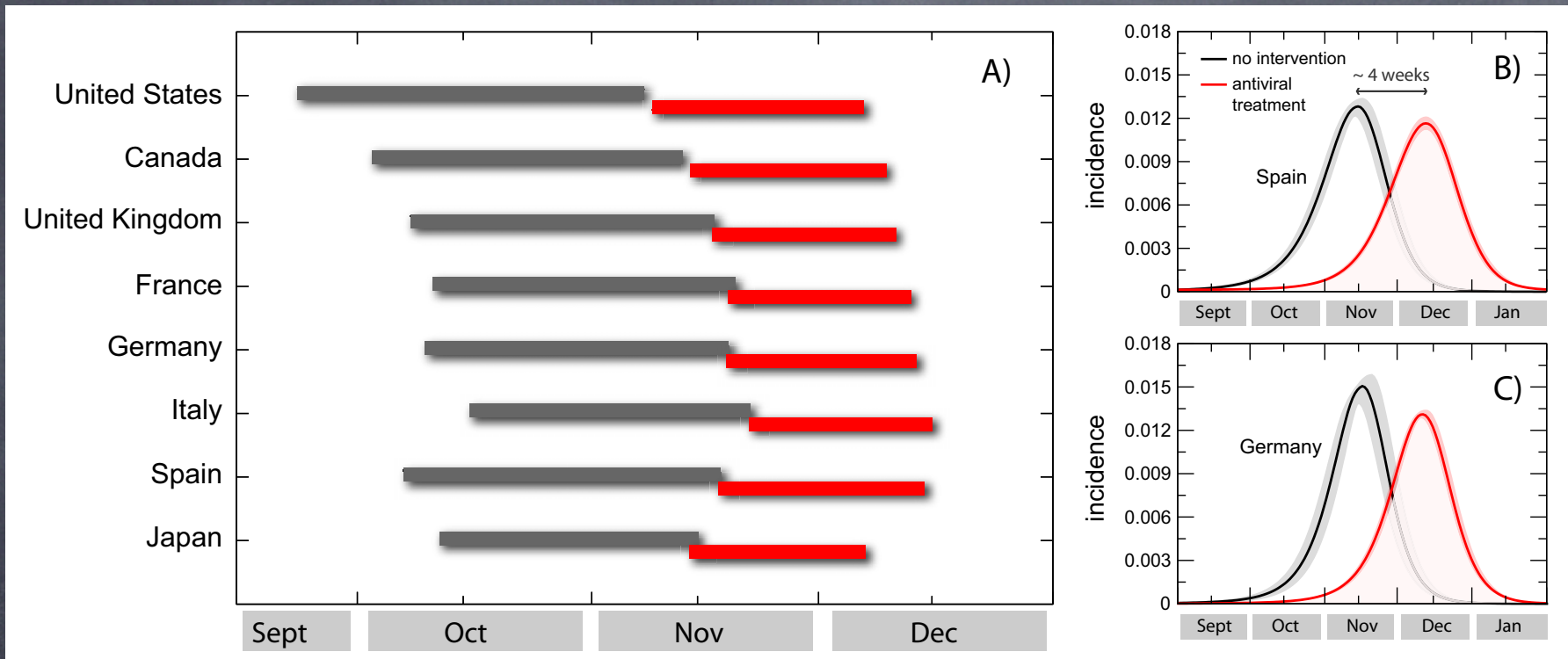
# Global Epidemic and Mobility (GLEaM) model



NIH1  
predictions

outbreak near  
La Gloria in  
Mexico, Feb.  
18, 2009

# Effects of systematic antiviral treatment



**Buys time for  
mass vaccinations**

- More topics you can read up on -

- **Pick your favourite model in classical statistical mechanics**
- **Synchronization phenomena**
- **Walking and searching on networks**
- **Social networks**
  - ➡ rumor and news spreading phenomena
  - ➡ voter models, coalition formation
  - ➡ economic models on networks
- **Biological networks**

The rest of the  
course...

Slides and organized citations: on line by evening of lecture.

3. Modeling transcriptional regulation,  
one promoter at a time

April 27

12 PM