

La fisica dei sistemi complessi

Complex networks: structure and dynamics

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Who is Alessio Cardillo?







Instituto Universitario de Investigación
**Biocomputación y Física
de Sistemas Complejos**
Universidad Zaragoza



**Universidad
Zaragoza**



ÉCOLE POLYTECHNIQUE
FÉDÉRALE DE LAUSANNE



IPHES^R

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Humana i Evolució Social**

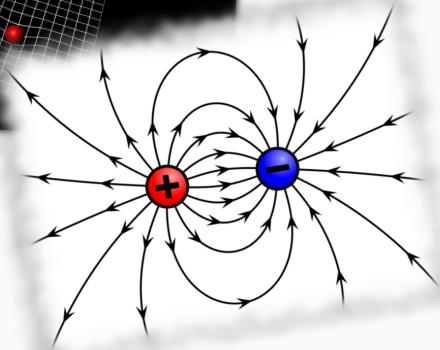
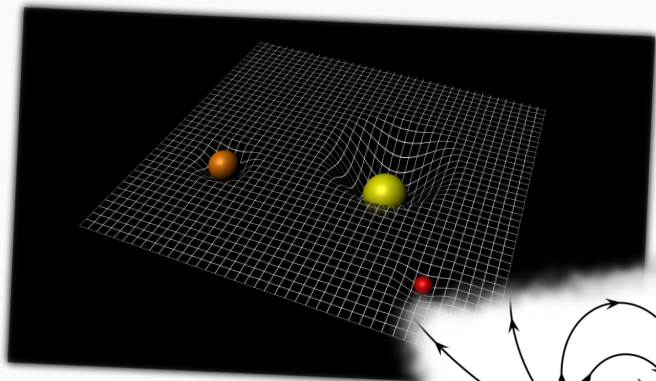


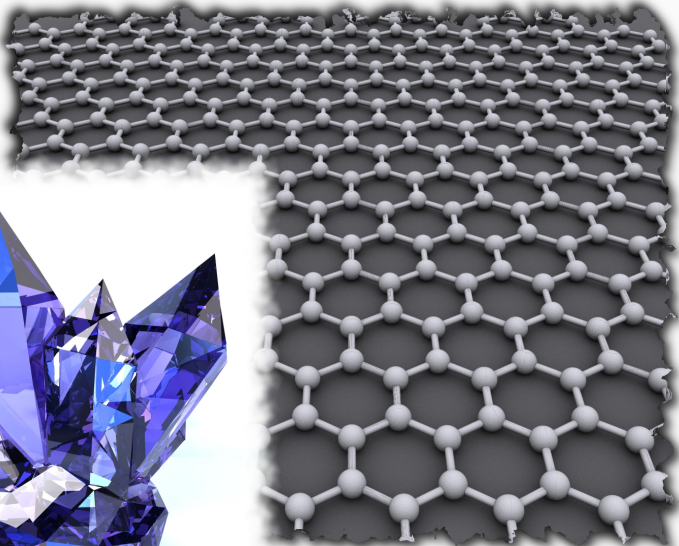
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Tackling complexity via networks: structure & dynamics







What is a complex system?

Answers

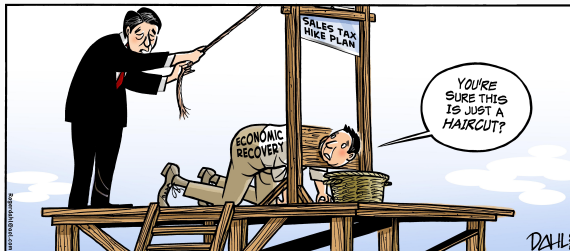
- Complex systems contain many constituents interacting **non linearly** (*i.e.* non-predictable);



Complex systems

Answers

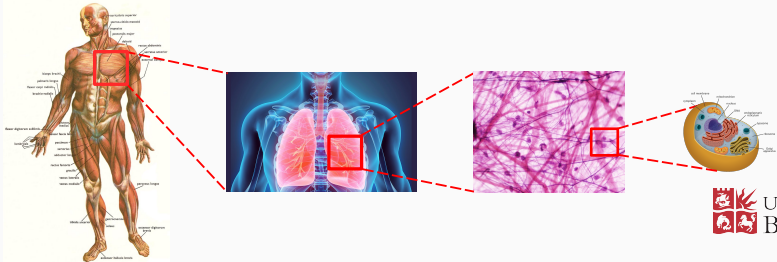
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- The constituents of a complex system are **interdependent**;



Complex systems

Answers

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- The constituents of a complex system are **interdependent**;
- A complex system possesses a structure spanning **several scales**;



Answers

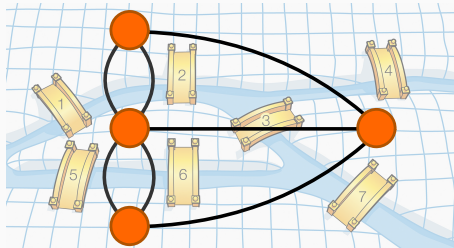
- Complex systems contain many constituents interacting **non linearly** (*i.e.* non-predictable);
- The constituents of a complex system are **interdependent**;
- A complex system possesses a structure spanning **several scales**;
- A complex system is capable of **emerging behavior**.



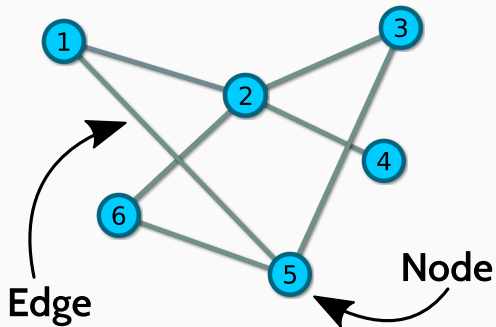
Graph Theory in a nutshell

A bit of history

In 1736 Leonard Euler found the answer to the **Königsberg bridge problem**, and gave birth to **graph theory**.



Graph Theory in a nutshell



$N \times N$ Adjacency matrix

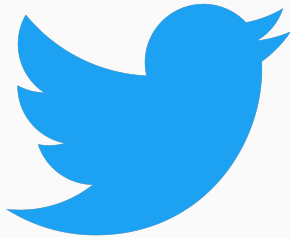
$$\begin{pmatrix} 0 & 1 & 0 & 0 & 1 & 0 \\ 1 & 0 & 1 & 1 & 0 & 1 \\ 0 & 1 & 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 0 & 0 & 0 \\ 1 & 0 & 1 & 0 & 0 & 1 \\ 0 & 1 & 0 & 0 & 1 & 0 \end{pmatrix}$$



Using networks to study complex systems is like paleontology ...

A world of connections . . .

A world of connections ...



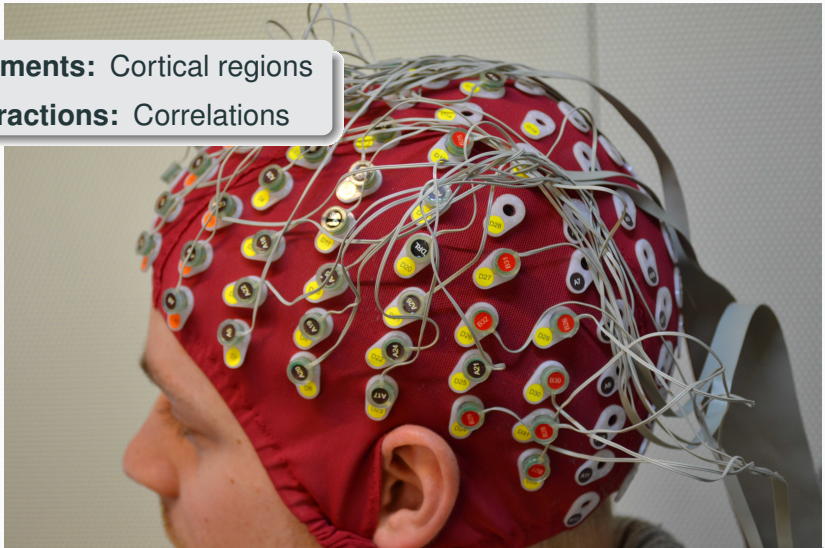
Elements: People

Interactions: Friendship

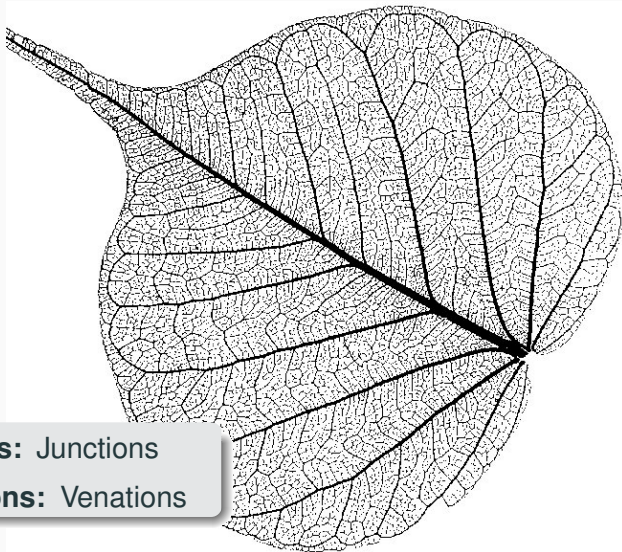
A world of connections . . .

Elements: Cortical regions

Interactions: Correlations



A world of connections ...



Elements: Junctions

Interactions: Venations

A world of connections . . .



Elements: Crossings
(locations)

Interactions: Streets

A world of connections . . .



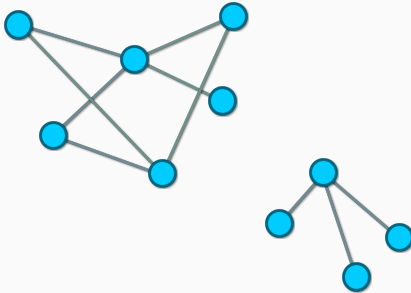
Disease spreading

Synchronization



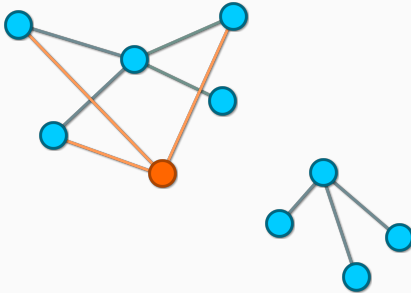
Cooperation





Percolation in a nutshell

1. Compute the number of nodes (size) of the **largest component**, $P_{\infty}(0) = 6$.



Percolation in a nutshell

2. With probability p , delete one node.



Percolation in a nutshell

3. Repeat the process for all the nodes.



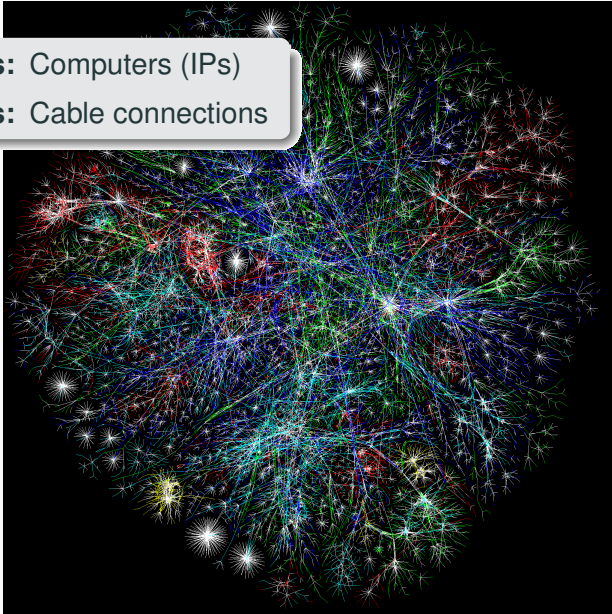
Percolation in a nutshell

4. Compute again the value of $P_{\infty}(p) = 5$.

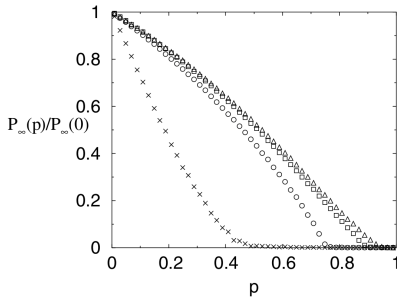
Dynamics on Networks

Nodes: Computers (IPs)

Edges: Cable connections



Random attack

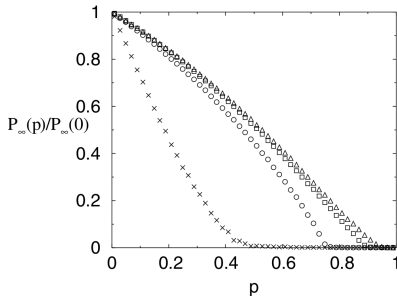


Internet is resilient to random failures.

- R. Cohen *et al.* (2000). Resilience of the Internet to Random Breakdowns. *Phys. Rev. Lett.*, **85**, 4626
- R. Cohen *et al.* (2001). Breakdown of the Internet under Intentional Attack. *Phys. Rev. Lett.*, **86**, 3682

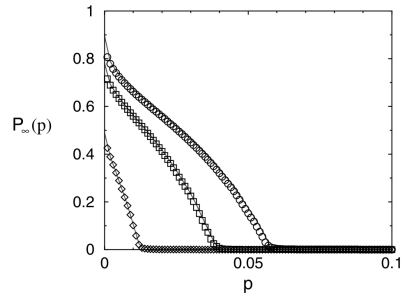
Dynamics on Networks

Random attack



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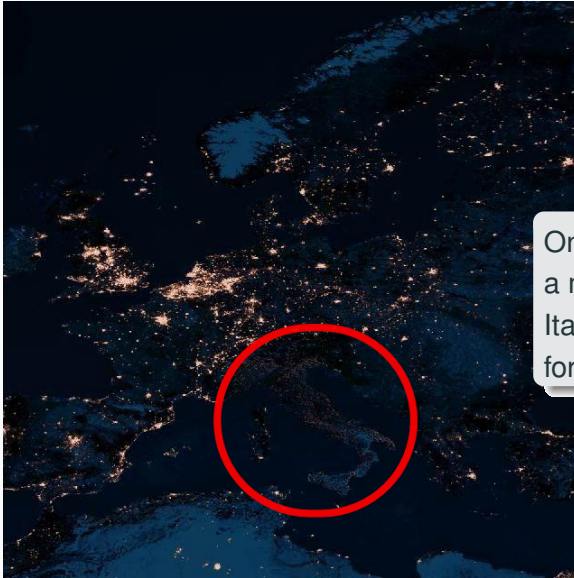
Targeted attack



Internet is extremely vulnerable to targeted attacks!

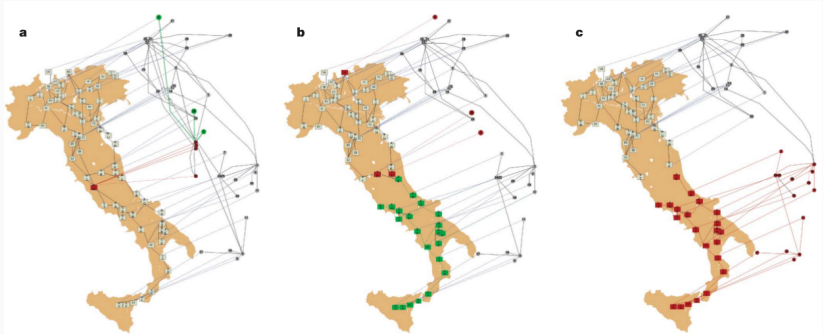
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A concrete example: Italy 2003 blackout



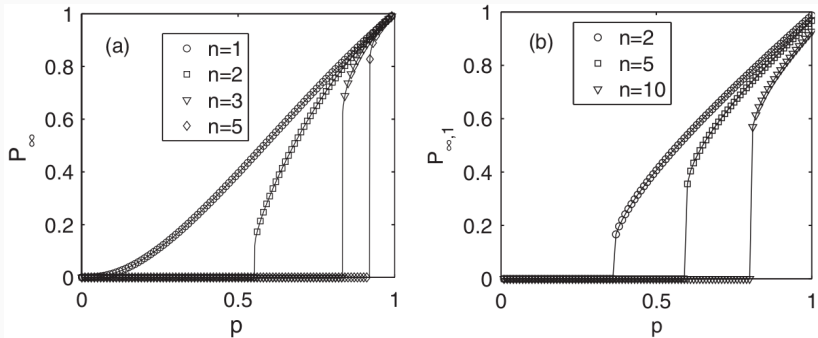
On the 28th of Sep. 2003
a major blackout affected
Italy (except for Sardinia)
for 12 hours.

A concrete example: Italy 2003 blackout



- Buldyrev S V, Parshani R, Paul G, Stanley H E, & Havlin S. *Catastrophic cascade of failures in interdependent networks*. Nature, **464**, 1025 (2010).

A concrete example: Italy 2003 blackout



- Gao J, Buldyrev S, Havlin S, & Stanley H E. *Robustness of a Network of Networks*. Phys. Rev. Lett., **107**, 195701 (2011).

Other applications

- Spreading of diseases/news/rumors
- Sociophysics
- Biophysics/Biology/Bioinformatics
- Econophysics
- Transportation
- Synchronization/Control
- Smart Cities
- Science of Science
- Language and Cognition
- Neuroscience
- ...

Other applications



What about Catania?



Vito Latora

Andrea Rapisarda



Alessandro Pluchino



Roberta
Sinatra



Manlio
De Domenico



Moreno
Bonaventura



Giovanna
Miritello

... and (many) others!

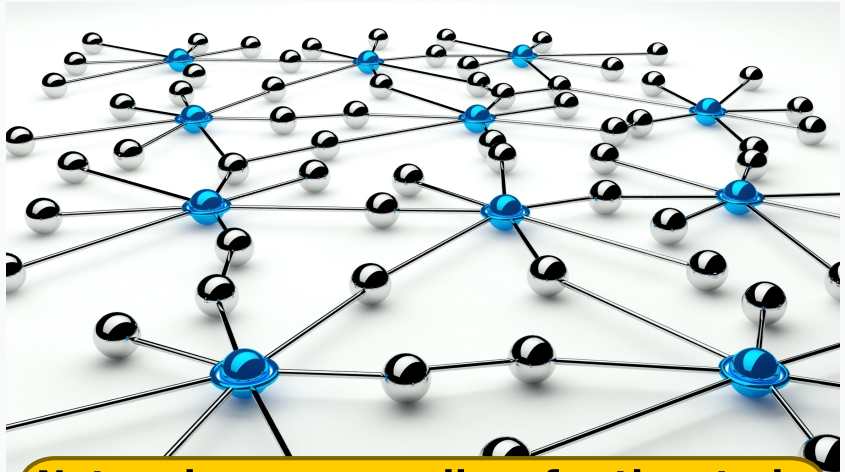
Summing up ...



Traveling abroad will enrich you both personally and professionally



Take home messages









Networks as a paradigm for the study of complex systems

Do what you like
the most

because you
will do it
BETTER!



Bibliography

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