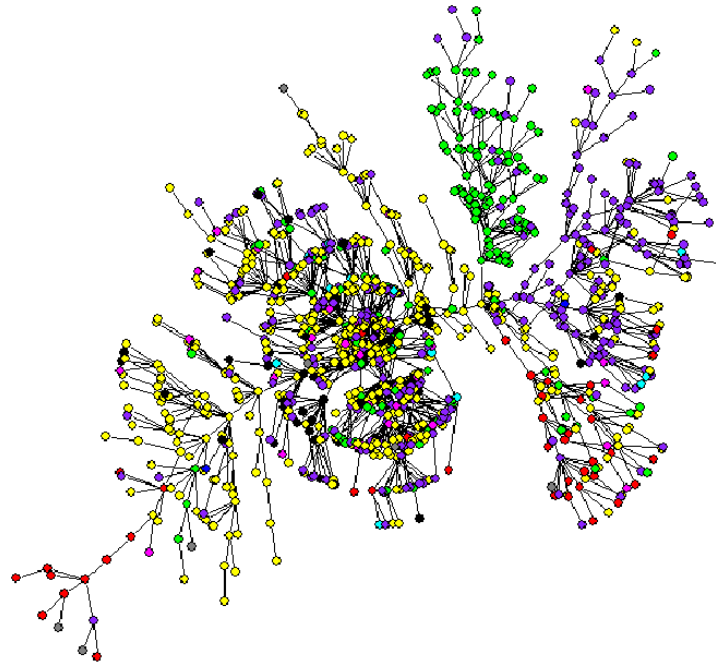
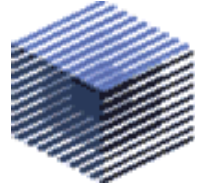


<http://www.cosin.org>

Networks in Finance



INFN



Istituto Nazionale
Fisica per la Materia

S. Battiston¹ G. Bonanno², G. Caldarelli³, M. Castri⁴, M. Catanzaro³, D. Garlaschelli^{3,5}, F. Lillo^{2,7},
R. Mantegna², L. Pietronero^{3,4,6}, V.D.P. Servedio³

1 École Normale Supérieure, Paris France

2 Osservatorio Sistemi Complessi, Università di Palermo Italy

3 INFN and Dipartimento di Fisica, Università "La Sapienza", Roma, Italy

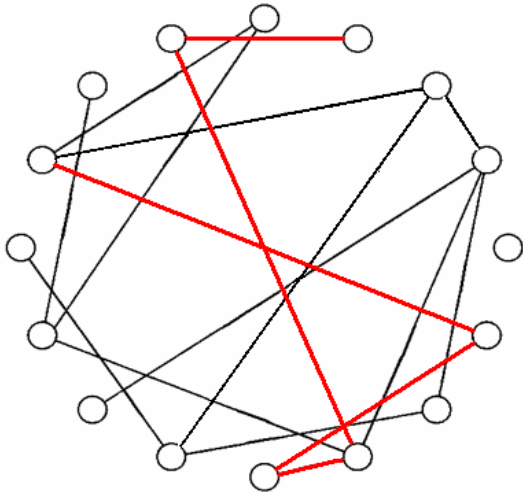
4 DYRAS'02, Monteleone Italy

5 INFN and Dipartimento di Fisica, Università di Siena, Italy

6 CNR Istituto di Acustica "O. M. Corbino", Roma Italy

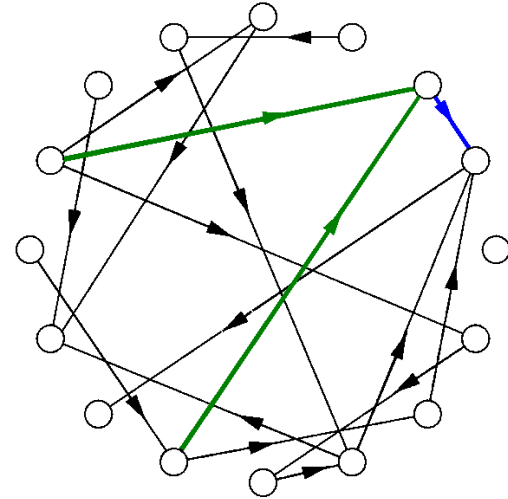
7 Santa Fé Institute

• Graph Topology

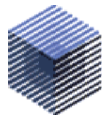
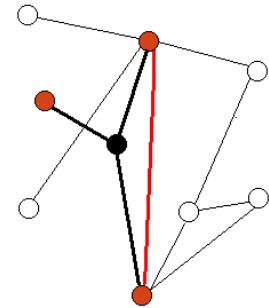
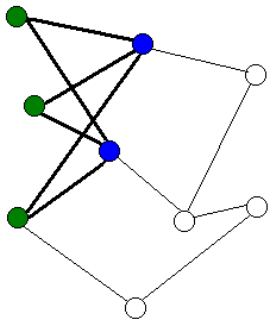


A **Graph** $G(v,e)$ is an object composed by v *vertices* and e *edges*

Edges can be oriented \rightarrow



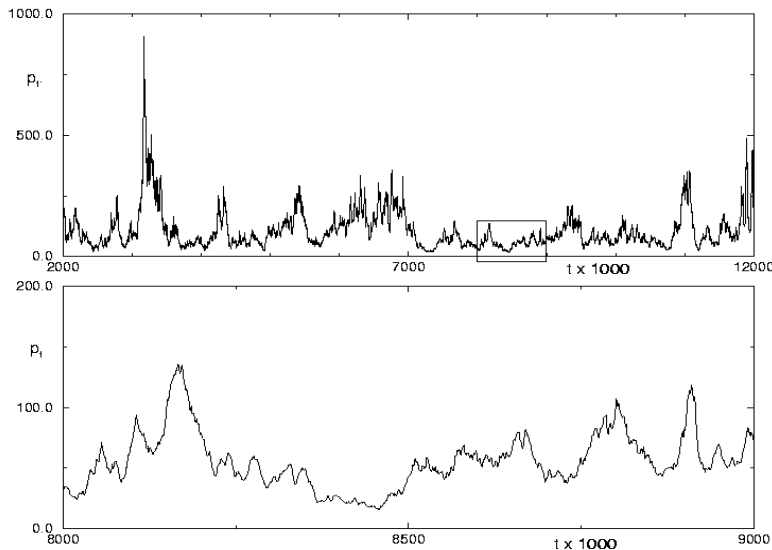
- **Degree** k (**In-degree** k_{in} and **out-degree** k_{out}) = number of edges (oriented) per vertex
- **Distance** d = number of edges amongst two vertices (in the connected region !)
- **Diameter** D = Maximum of the distances (in the connected region !)
- **Clustering** = cliques distribution, or clustering coefficient



Economics and Finance

Probably the most complex system is human behaviour!

Even by considering only the trading between individuals, situation seem to be incredibly complicated.

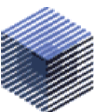
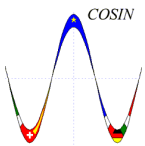


Econophysics tries to understand the basic “active ingredients” at the basis of some peculiar behaviours.

For example price statistical properties can be described through a simple model of agents trading the same stock.

“A Prototype Model of Stock Exchange”

Europhysics Letters, **40** 479 (1997), G. C., M. Marsili, Y.-C. Zhang.



• Why networks ?

Some of the phenomena in finance can be described by means of graphs

• Stock price correlations

• J.-P. Onnela, A. Chackrabarti, K. Kaski, J. Kertész, A. Kanto

<http://xxx.lanl.gov/abs/cond-mat/0303579> and <http://xxx.lanl.gov/abs/cond-mat/0302546>

• G. Bonanno, G. Caldarelli, F. Lillo and R. N. Mantegna *<http://xxx.lanl.gov/abs/cond-mat/0211546>*

• Board of Directors

• M. E. J. Newman, S. H. Strogatz and D. J. Watts, *Phys. Rev. E* **64**, 026118 (2001).

• S. Battiston, E. Bonabeau and G. Weisbuch *<http://xxx.lanl.gov/abs/cond-mat/0209590>* (2002).

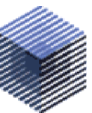
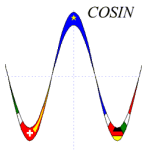
• Portfolio composition

• Next slides...

Through this new description we can

• Discover new features

• Validate Models



- **Stock Price Correlations**

$$r_i(\tau) = \ln P_i(\tau) - \ln P_i(\tau - 1)$$

Logarithmic return of stock i

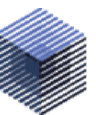
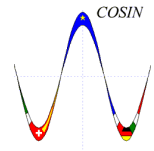
$$\rho_{i,j} = \frac{\langle r_i r_j \rangle - \langle r_i \rangle \langle r_j \rangle}{\sqrt{(\langle r_j^2 \rangle - \langle r_j \rangle^2)(\langle r_i^2 \rangle - \langle r_i \rangle^2)}}$$

Correlation between returns
(averaged on trading days)

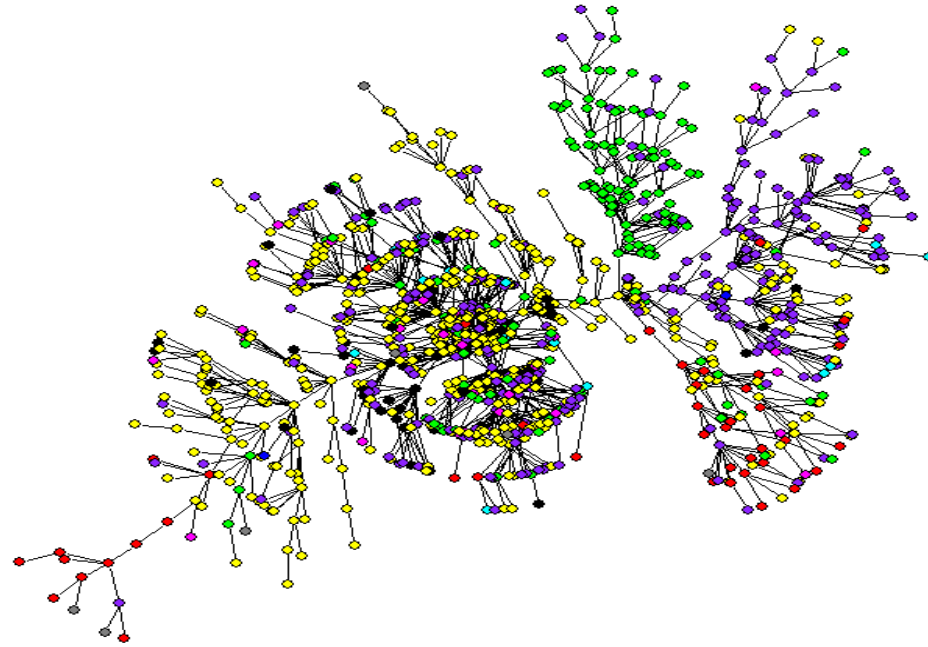
$$d_{i,j} = \sqrt{2(1 - \rho_{i,j})}$$

Distance between stocks i, j

A tree (a graph with no cycle) can be constructed by imposing that the sum of the (N-1) distances is the minimum one.



Real Data from NYSE



Correlation based minimal spanning trees of real data from daily stock returns of 1071 stocks for the 12-year period 1987-1998 (3030 trading days). The node colour is based on Standard Industrial Classification system.

The correspondence is:

red for mining

cyan for construction

yellow for manufacturing

green for transportation, communications,
electric, gas and sanitary services

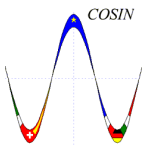
light blue for public
administration

magenta for wholesale trade

black for retail trade

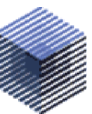
purple for finance and insurance

orange for service industries



“**Topology of correlation based..**” <http://xxx.lanl.gov/abs/cond-mat/0211546>

G. Bonanno, G. C. , F. Lillo, R. Mantegna



Data from Capital Asset Pricing Model

In the model it is supposed that returns follow

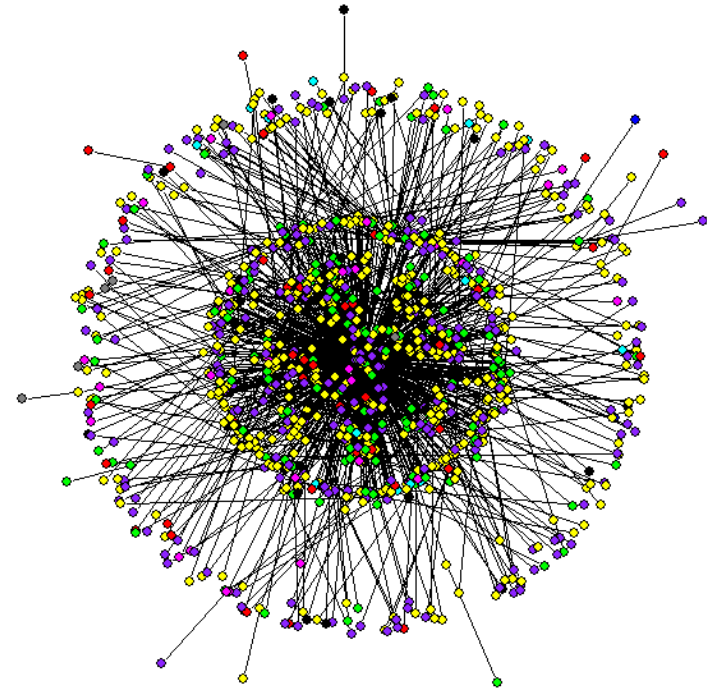
$$r_i(t) = \alpha_i + \beta_i r_M(t) + \varepsilon_i(t)$$

$r_i(t)$ = return of stock i

$r_M(t)$ = return of market (Standard & Poor's)

α_i, β_i = real parameters

ε_i = noise term with 0 mean



Correlation based minimal spanning trees of of an artificial market composed by of 1071 stocks according to *the one factor model*.

The node colour is based on Standard Industrial Classification system. The correspondence is:

red for mining

cyan for construction

yellow for manufacturing

green for transportation, communications,
electric, gas and sanitary services

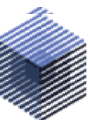
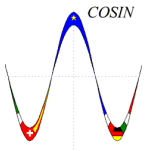
light blue for public
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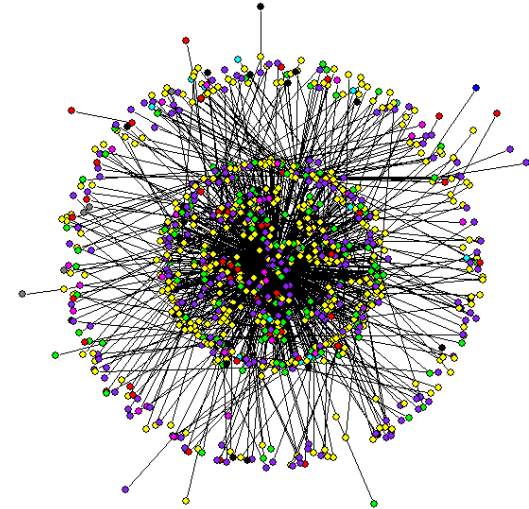
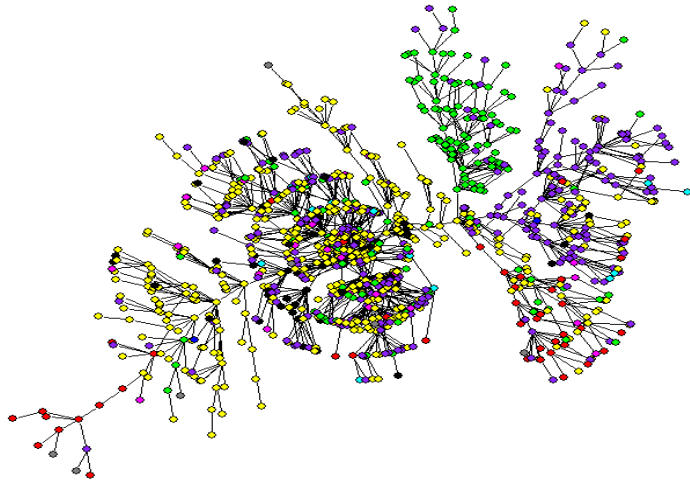
magenta for wholesale trade

black for retail trade

purple for finance and insurance

orange for service industries



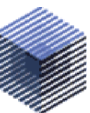
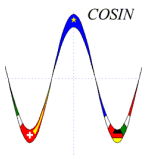


Without going in much detail about degree distribution or clustering of the two graphs

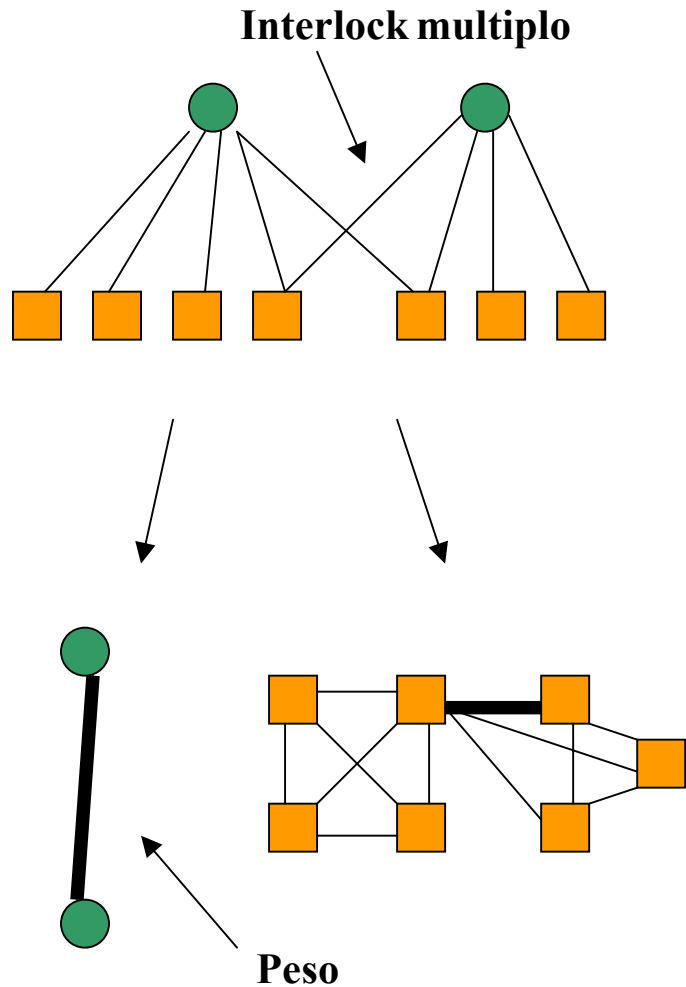
We can conclude that:

the topology of MST for the real and an artificial market are greatly different.

Real market properties are not reproduced by simple random models



Rete dei consigli di amministrazione italiani



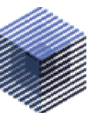
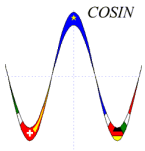
Grafo bipartito:

- nodi di due classi (società e amministratori),
- archi fra nodi di classi diverse.

Proiezioni

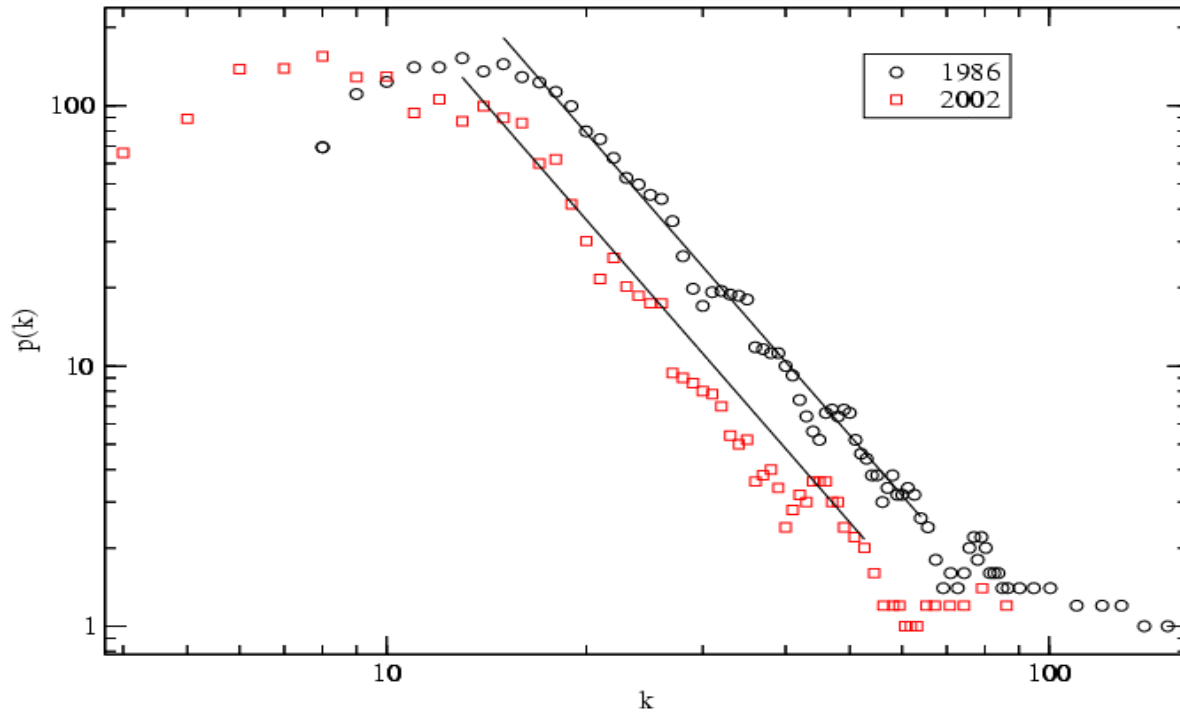
Collegamento fra due società (amministratori) se hanno un amministratore (società) in comune.

Peso.



L'invarianza di scala

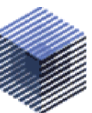
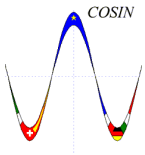
La rete esibisce invarianza di scala rispetto a diverse grandezze.



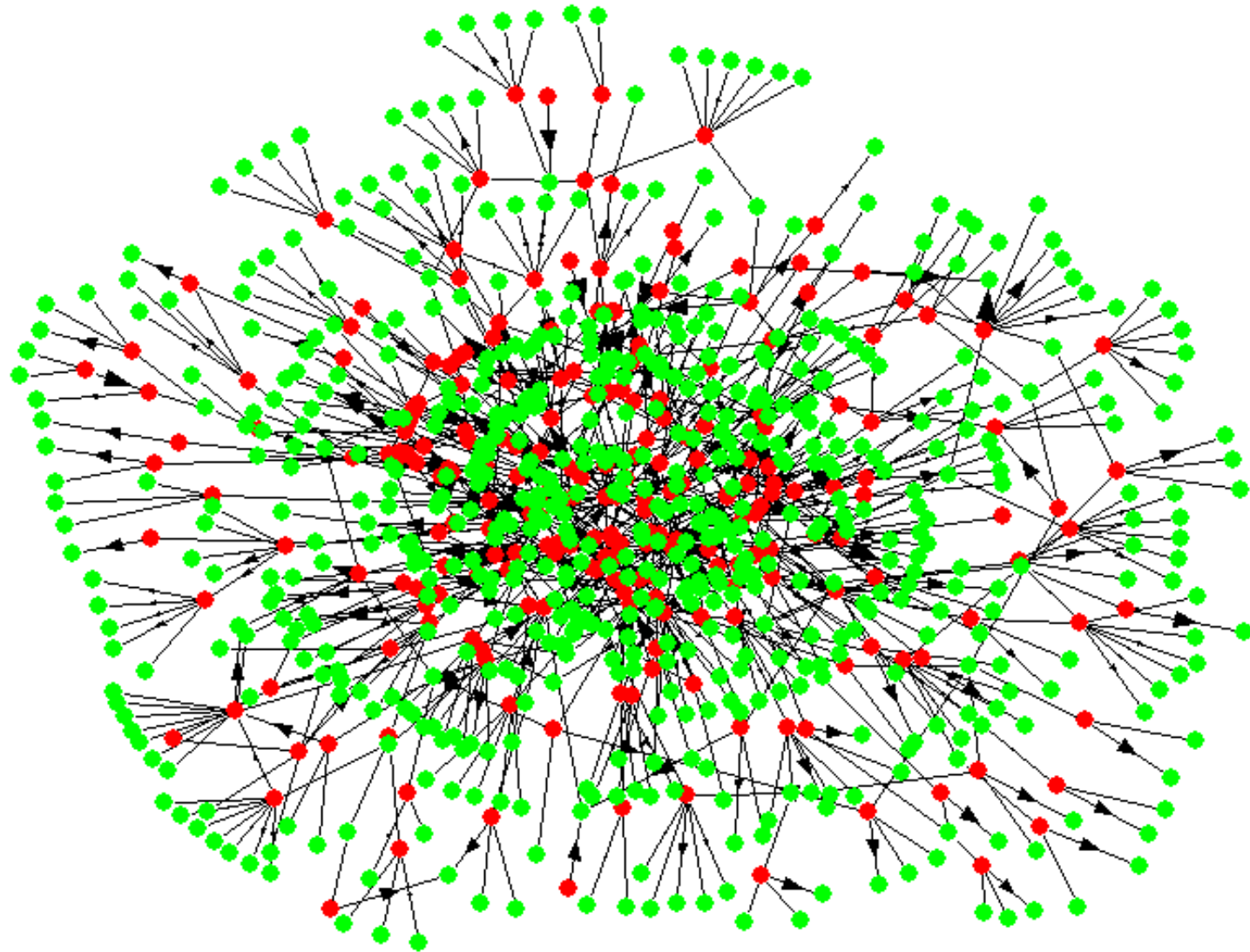
(rete degli amministratori)

$$P(k) \propto k^{-\gamma}$$

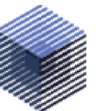
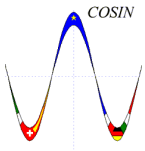
$$\gamma = 2.92 \pm 0.08$$



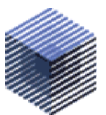
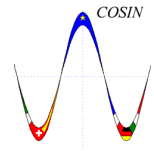
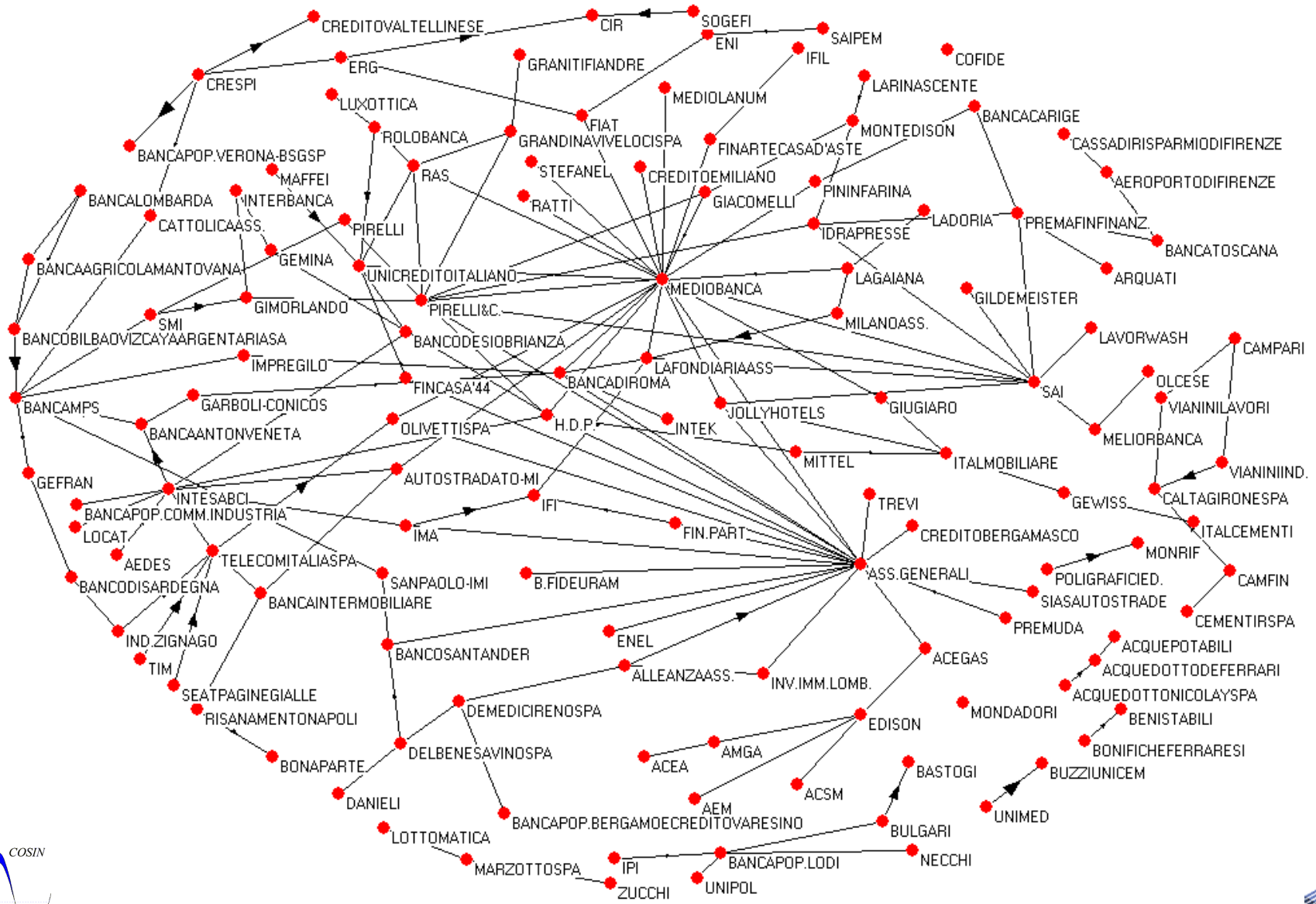
Portfolio Composition

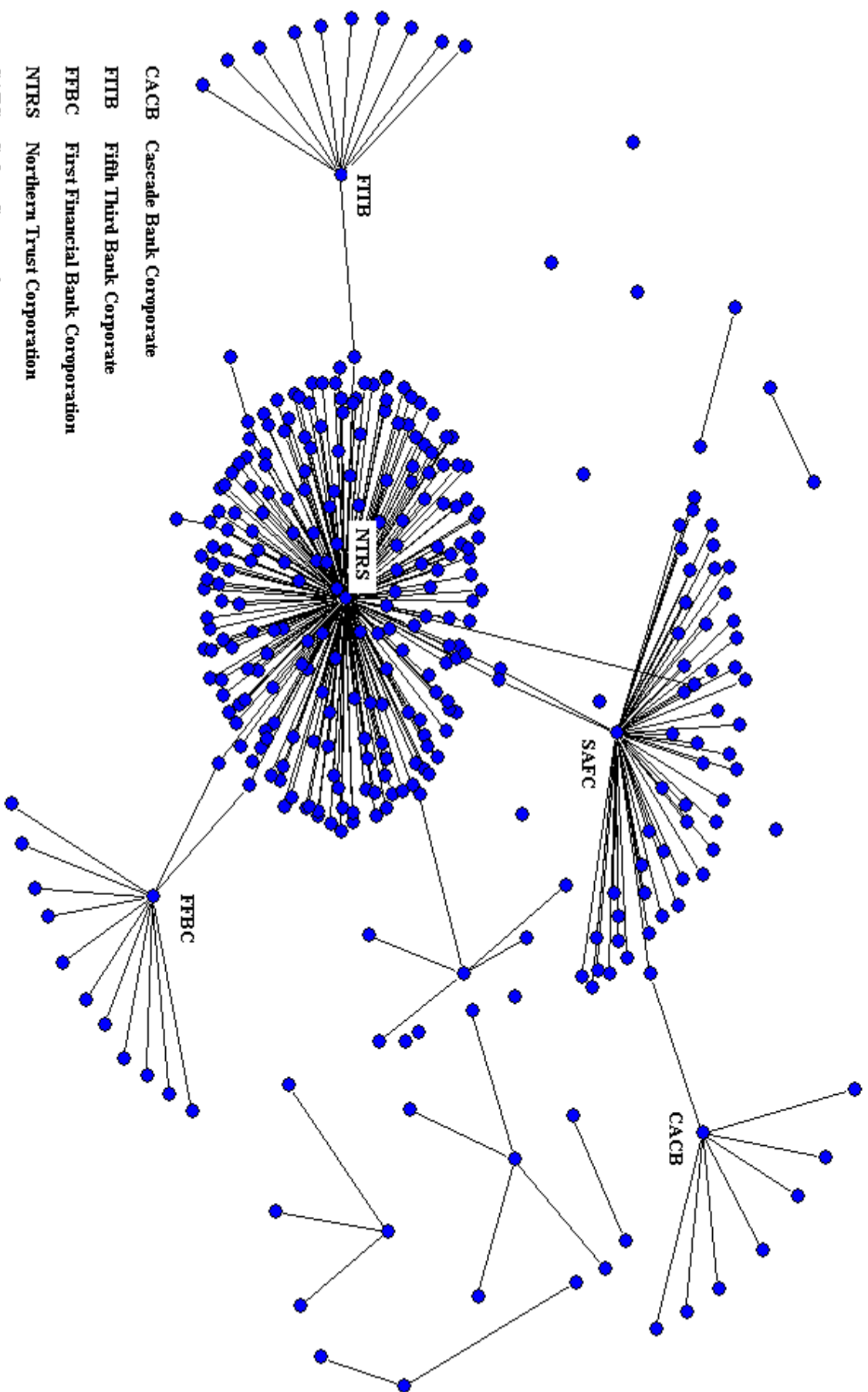


- Investors or Companies not traded at Borsa di Milano (Italy)
- Companies traded at Borsa di Milano (Italy)



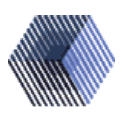
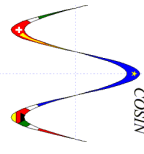
Portfolio Composition

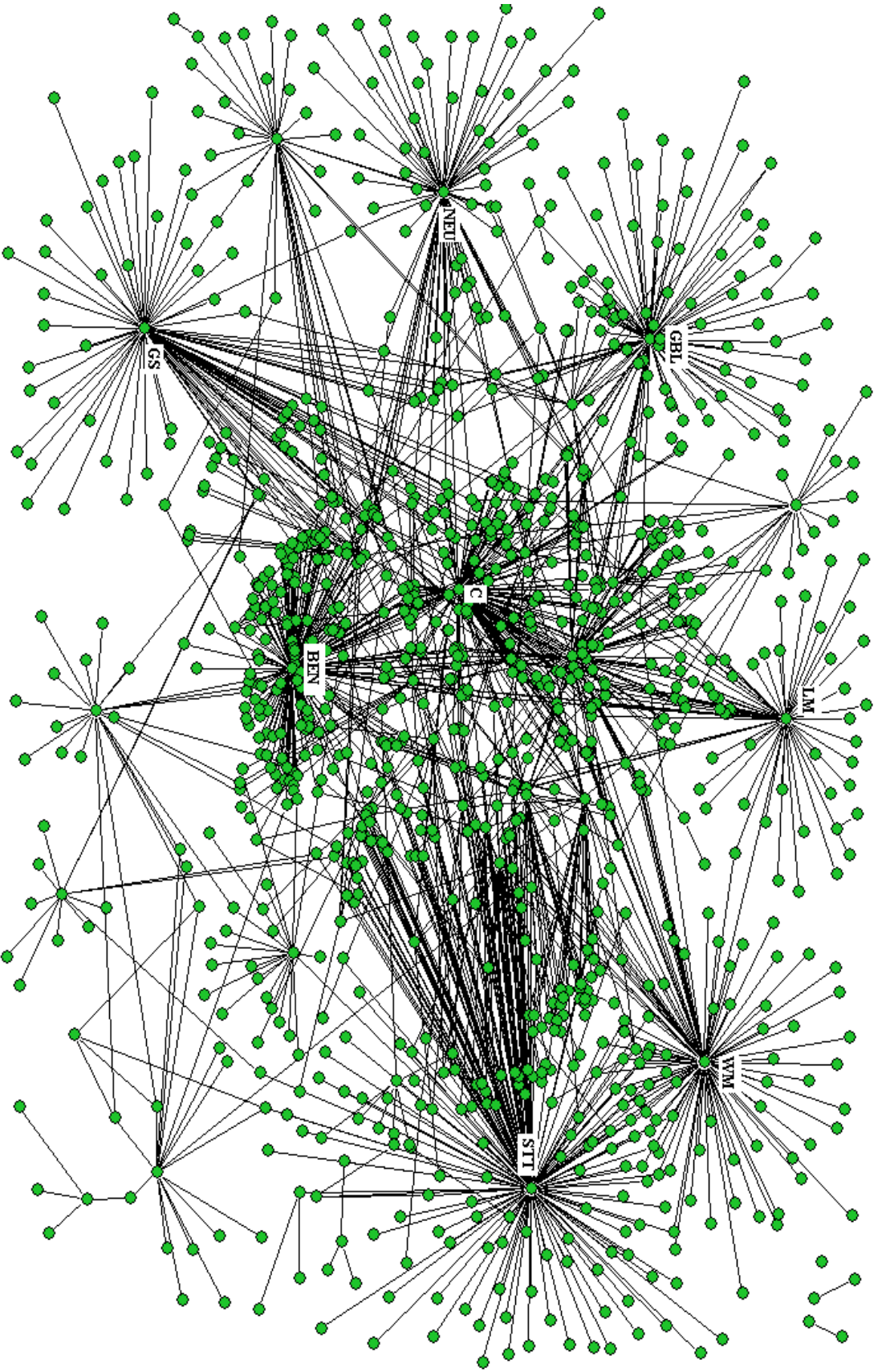




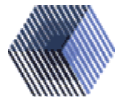
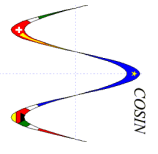
COSN
SAFCC Safeco Corporation

NTRS Northern Trust Corporation
FFBC First Financial Bank Corporation
FTIB Fifth Third Bank Corporate
CACB Cascade Bank Corporate



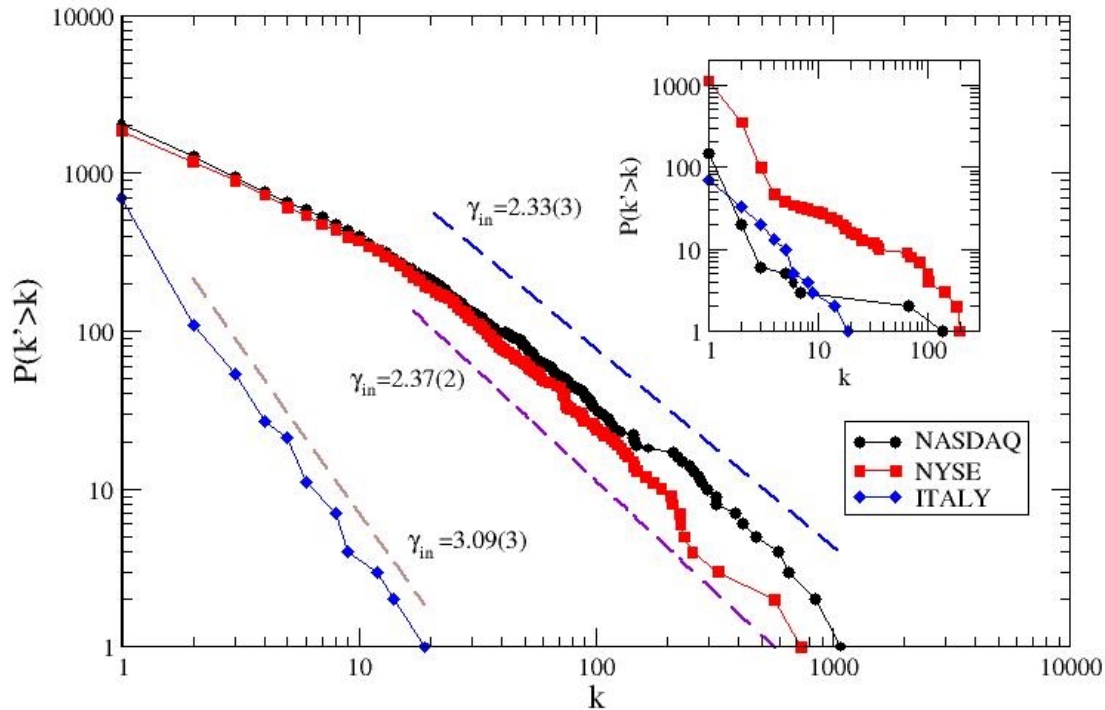


BEN Franklin Res Inc C Citigroup GS Goldman Sachs GBL Gabelli Asset Man LMLegg Mason INC NEU Neuberger Bergman STT State Street WM Washington Mutual



Cumulative in-degree distribution (portfolio diversification)

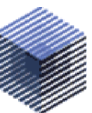
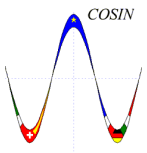
$$P(k) \propto k^{-\gamma}$$



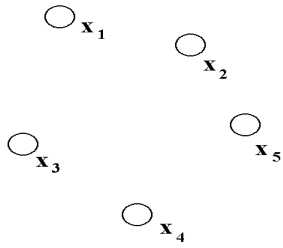
Sharp contrast with the Portfolio Composition predicted by the CAPM model:

The optimal portfolio spans all M assets in the market, with weights proportional to their market capitalization:

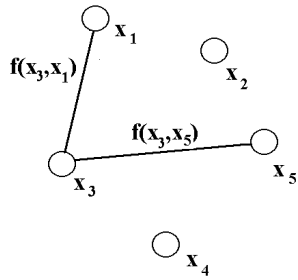
$$k_i = M \quad \forall i$$



Can we reproduce the observed heterogeneity by means of a simple network model?



Each investor/asset has a ‘fitness’ (wealth/performance) drawn from a probability distribution $\rho(x)$



Edges are drawn with probability $f(x_i, x_j)$

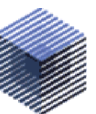
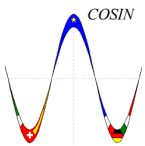
Suppose: $f(x_i, x_j) = g(x_i)h(x_j)$

Then we expect a wealth-dependent portfolio diversification:

$$k(x) \propto g(x)$$

G.C, A. Capocci, P. De Los Rios, M.A. Munoz *PRL* **89**, 258702 (2002).

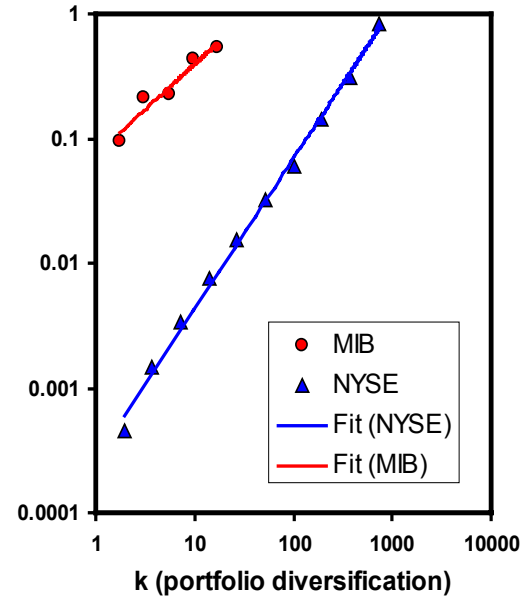
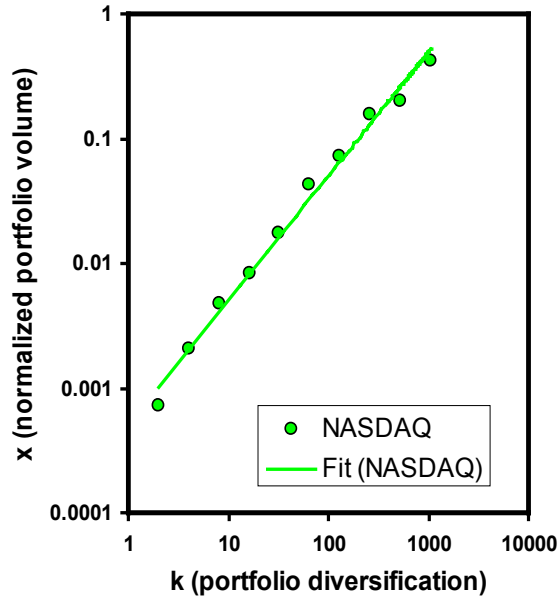
If we choose x_i as the total number of shares that i wants to invest, we can measure both $g(x)$ and $\rho(x)$ directly.



$x = \text{portfolio volume (total shares held)}$

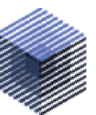
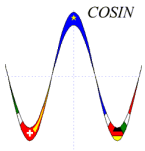
$k = \text{portfolio diversification (number of different assets)}$

$$x(k) \propto k^{1/\beta}$$



$$k(x) \propto x^\beta$$

- $\beta_{Nasdaq} = 1$ (linear)
- $\beta_{Nyse} = 0.86$ (sublinear)
- $\beta_{Mib} = 1.41$ (superlinear)

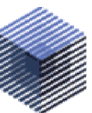
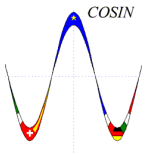


- **Conclusions (?)**

Financial Networks can help

- In distinguishing behaviour of different markets
- In visualizing important features as the chain of control
- In testing the validity of market models

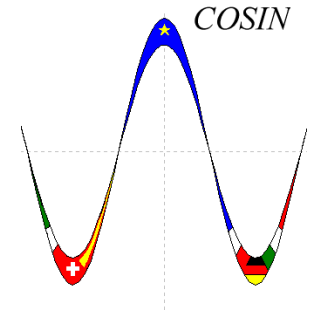
They might be an example of scale-free networks even more general than those described by growth and preferential attachment.





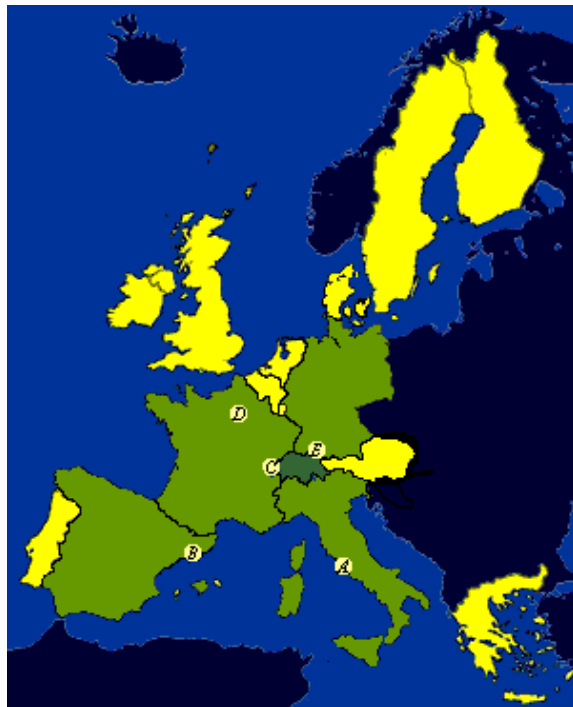
COSIN

COevolution and Self-organisation In dynamical Networks







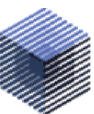
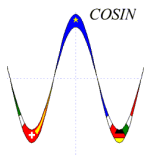
RTD Shared Cost Contract IST-2001-33555

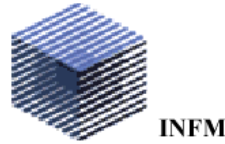
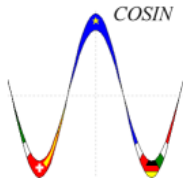
<http://www.cosin.org>



- **Nodes** 6 in 5 countries
- **Period of Activity:** April 2002-April 2005
- **Budget:** 1.256 M€
- **Persons financed:** 8-10 researchers
- **Human resources:** 371.5 Persons/months

-  EU countries
-  Non EU countries
-  EU COSIN participant
-  Non EU COSIN participant





MIDTERM CONFERENCE COSIN (FET Open Project IST-2001-33555)

Conference on Growing Networks and Graphs in Statistical Physics, Finance, Biology and Social Systems

Roma 1-5 September 2003

Aule S. Pietro in Vincoli, Facoltà di Ingegneria, Università di Roma "La Sapienza" v. Eudossiana 18

<http://www.cosin.org/midterm.html>

Tentative List of Speakers

| | | |
|---|---|---|
| L. Adamic (<i>HP Palo Alto</i>) | L. Amaral (<i>NorthWestern Univ.</i>) | A. Arenas (<i>Univ. Tarragona</i>) |
| A.-L. Barabási (<i>Notre Dame</i>) | B. Bollobas (<i>Memphis</i>) | A. Broder* (<i>Altavista</i>) |
| W. R. Cheswick (<i>Lumeta</i>) | P. De Los Rios (<i>IPT, Lausanne</i>) | S. Dorogotsev (<i>Porto</i>) |
| A. Erzan (<i>Istanbul Univ.</i>) | B. Kahng (<i>Seoul Univ.</i>) | J. Kertesz (<i>Eotvos Institute</i>) |
| R. Mantegna (<i>Palermo</i>) | N. Martinez* (<i>S. Francisco Univ.</i>) | S. Maslov (<i>Brookhaven</i>) |
| F. Menczer* (<i>Iowa Univ.</i>) | J. J. Mendes (<i>Porto</i>) | R. V. Solé (<i>UPF Barcelona</i>) |
| A. M. Spaccamela (<i>Roma</i>) | H. E. Stanley (<i>Boston Univ.</i>) | Z. Toroczkai (<i>LANL</i>) |
| D. Wagner (<i>Konstanz Univ.</i>) | G. Weisbuch (<i>ENS</i>) | Y.-C. Zhang (<i>Fribourg</i>) |

Registration

Details about registration forms, contribute submissions, accommodation and tentative programme at web site <http://www.cosin.org/midterm.html> or e-mail Ms. Francesca Consales consales@pil.phys.uniroma1.it