

# Statistical physics of interacting agents on complex networks

## COST 1P04OCP10.001

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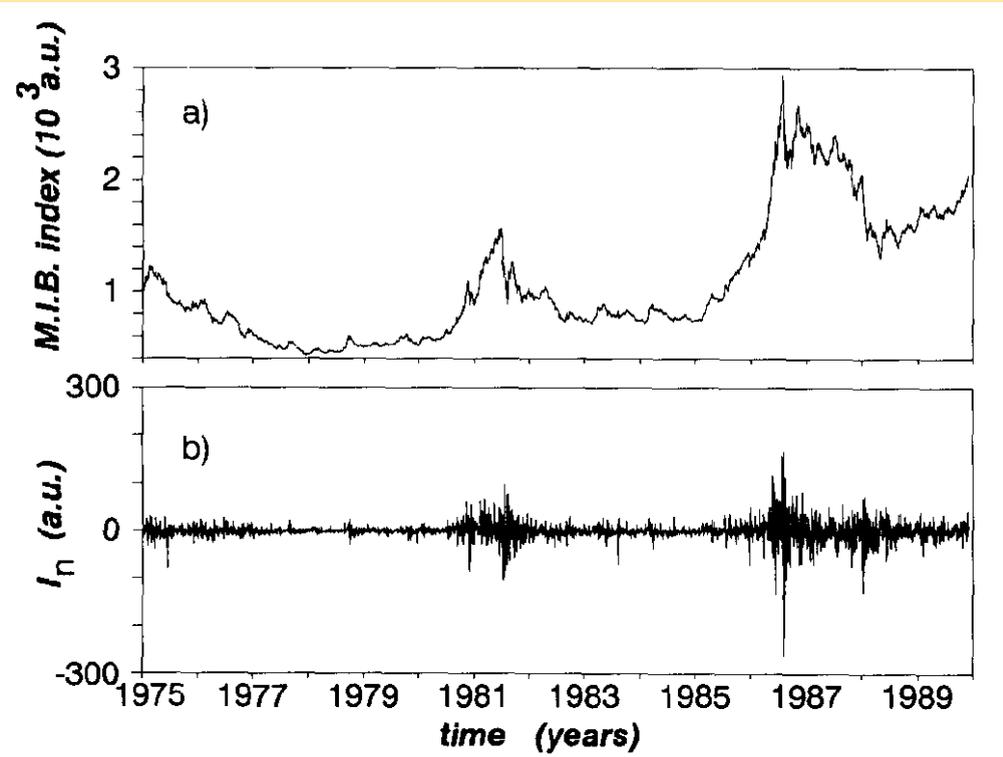
`slanina@fzu.cz`

- Phenomenology of markets and networks
- Price fluctuations
- Imitation structures
- Social networks in electronic commerce
- Model of social divergence
- Thanks to MŠMT



# Econophysical phenomenology

[R. N. Mantegna, Physica A 179, 232 (1991)]

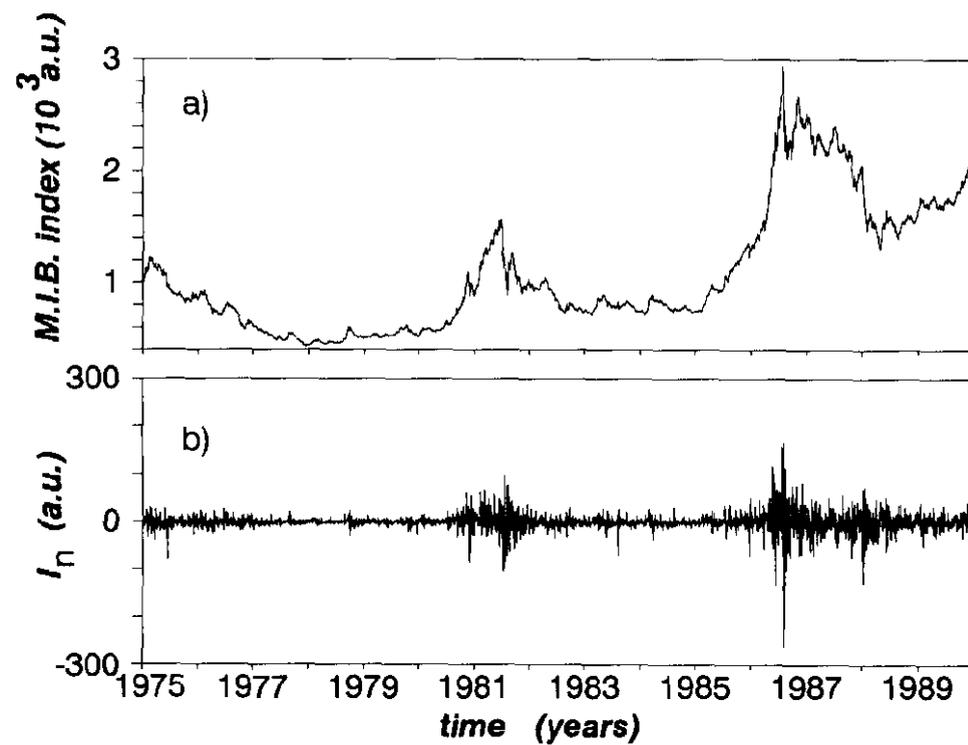


Time evolution of Milano Stock market index and returns.

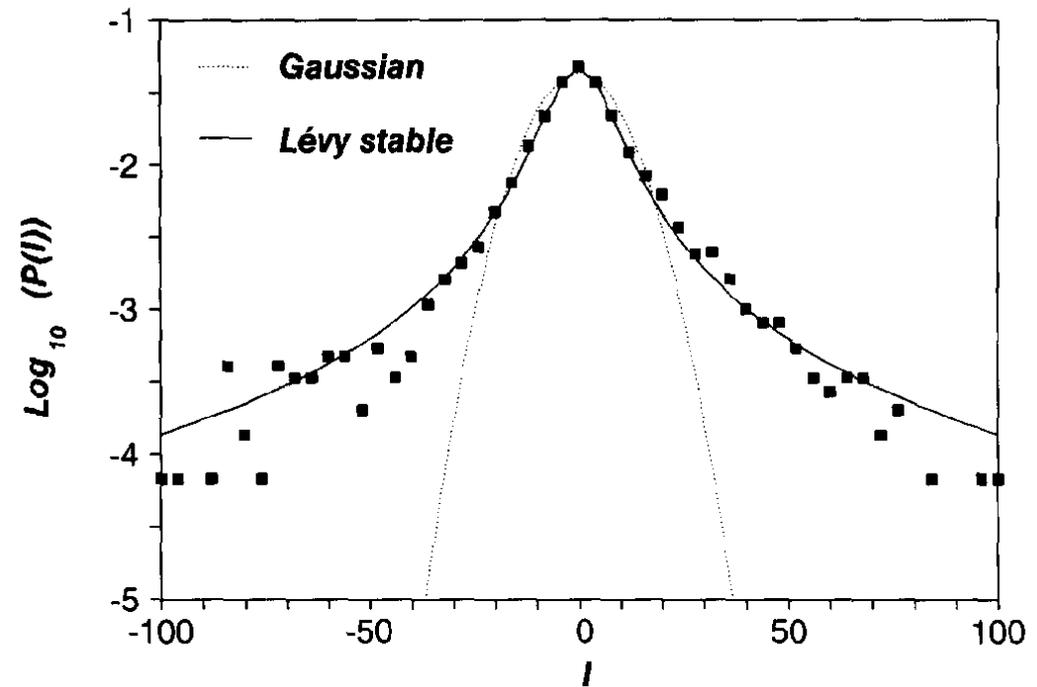


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Histogram of time changes in Milano Stock market.

$$P(I) \propto I^{-\alpha}, \alpha \simeq 2.4.$$

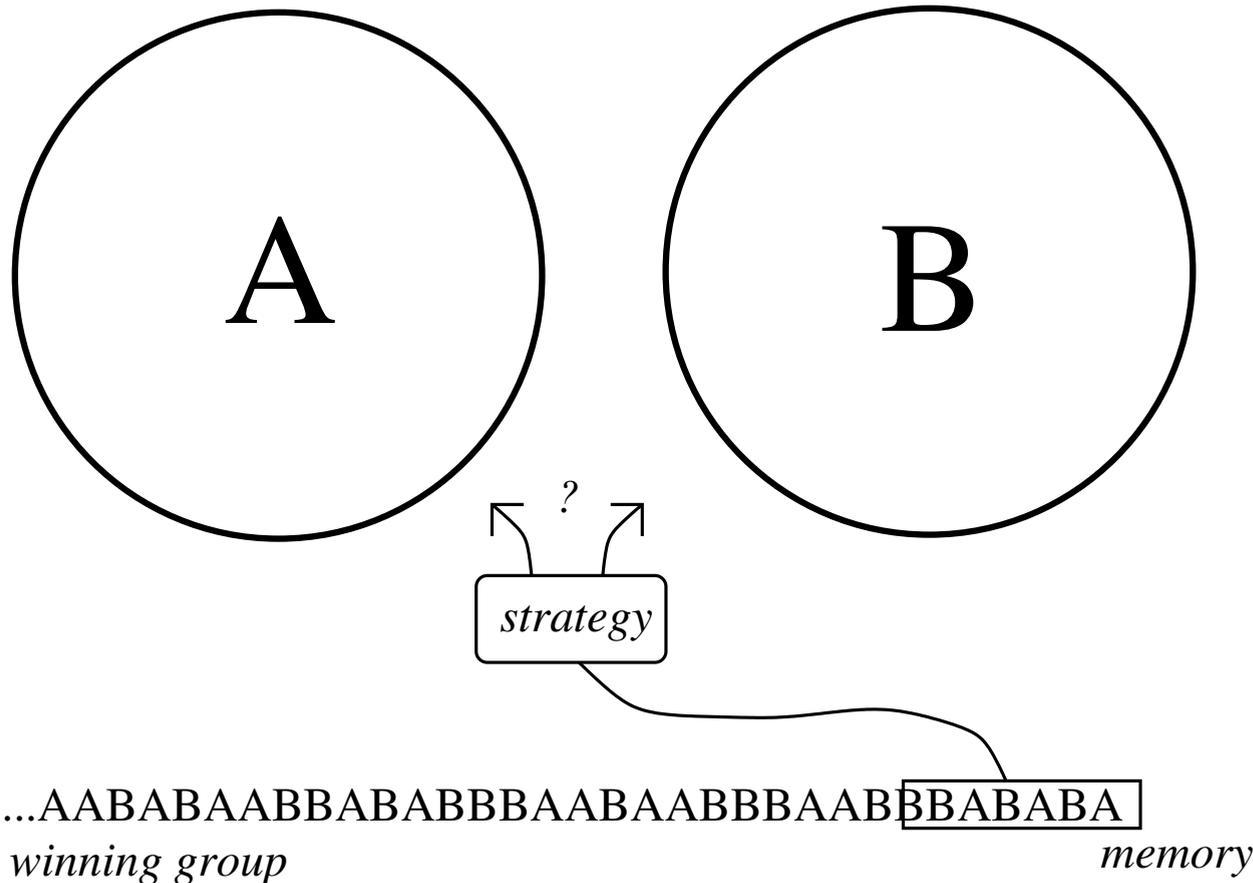


**Minority Game:** [W. B. Arthur Amer. Econ. Review 84,406 (1994).

D. Challet and Y.-C. Zhang, Physica A 246, 407 (1997).]

*El Farol* bar attendance problem: go to bar (B) or stay at home (A)?

Abstract formulation:



$N$  players

$S$  strategies,

memory length  $M$ .

Strategy with highest score is chosen.

**Features: On-line adaptation. No optimal strategy possible.**



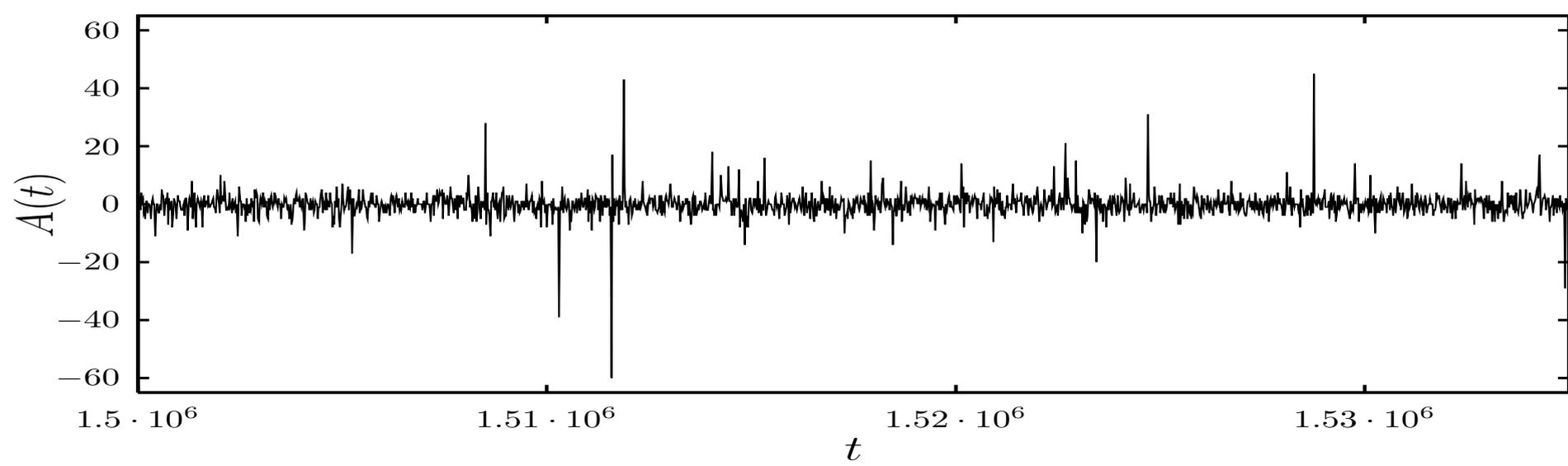
# Grand-canonical Minority Game

$N_p$  producers (always play)  $N_s$  speculators (play only if profitable)



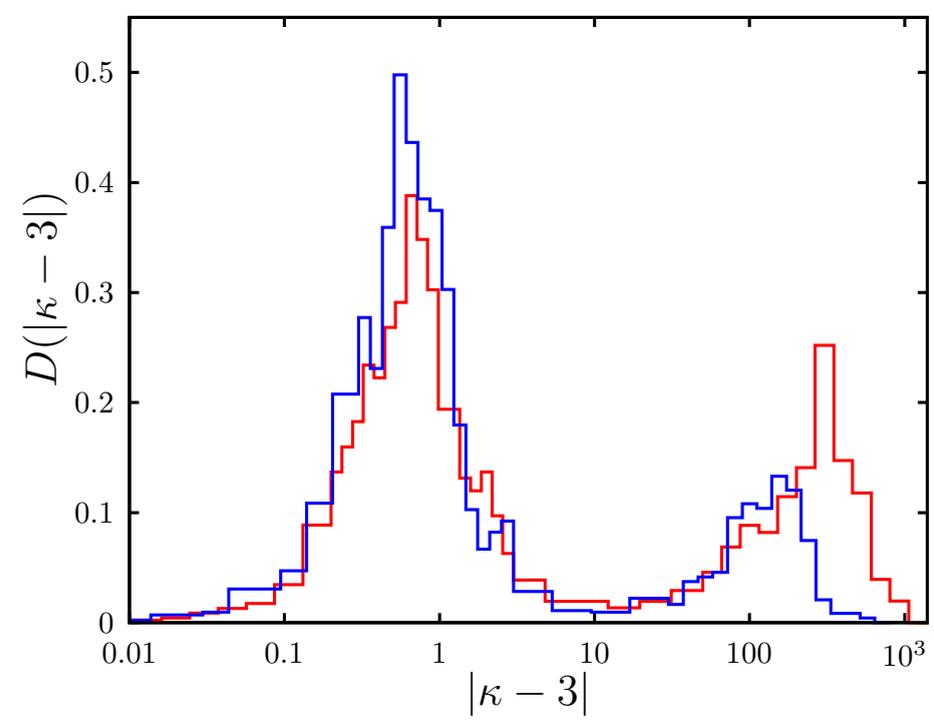
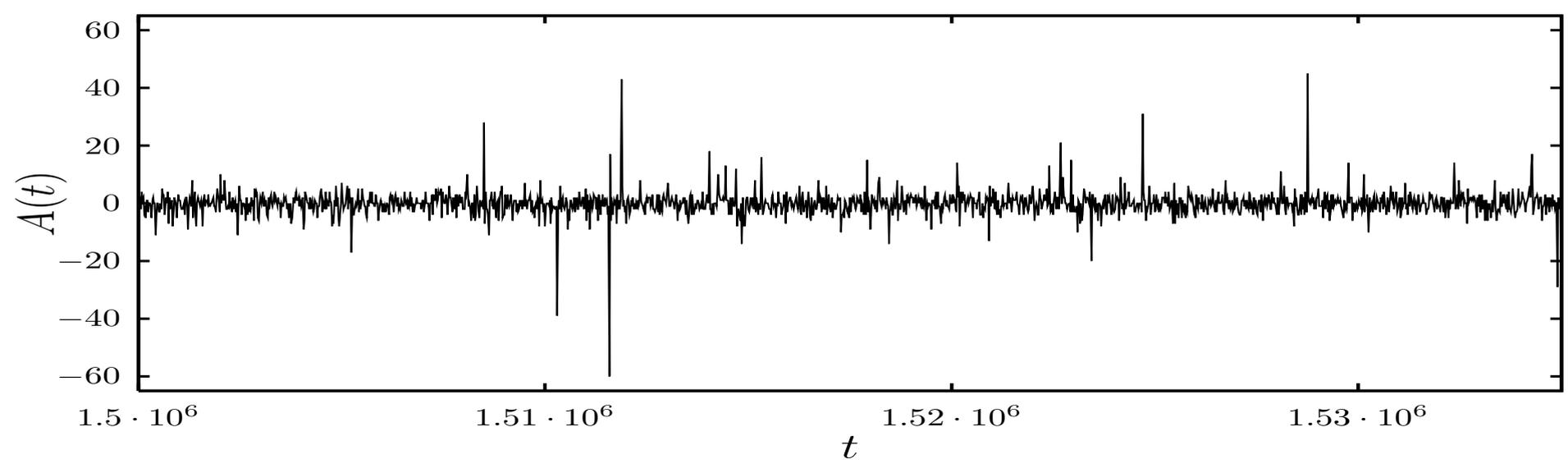
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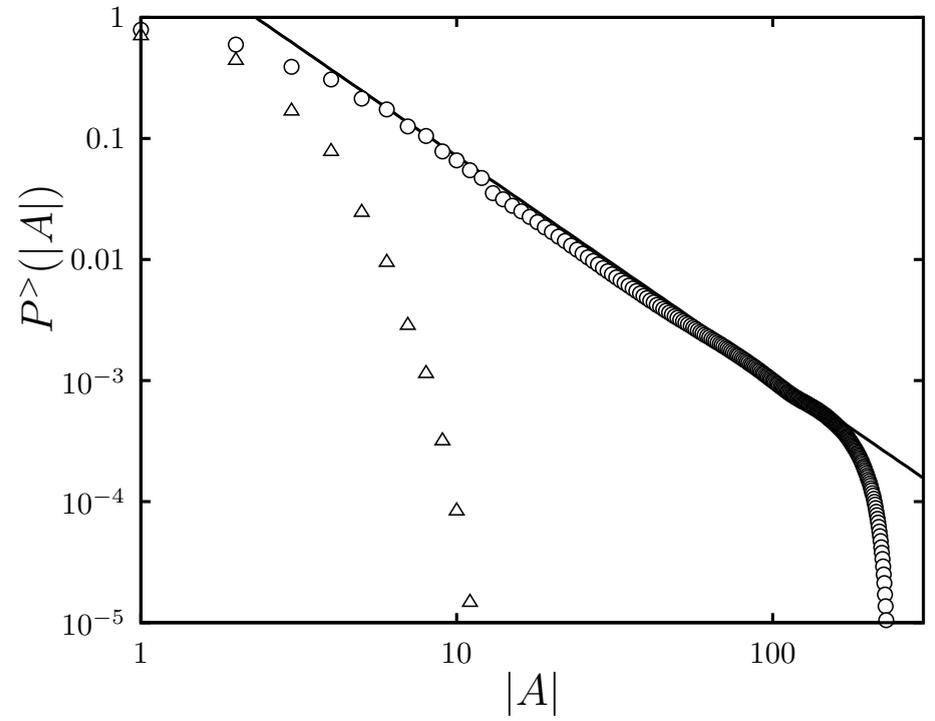
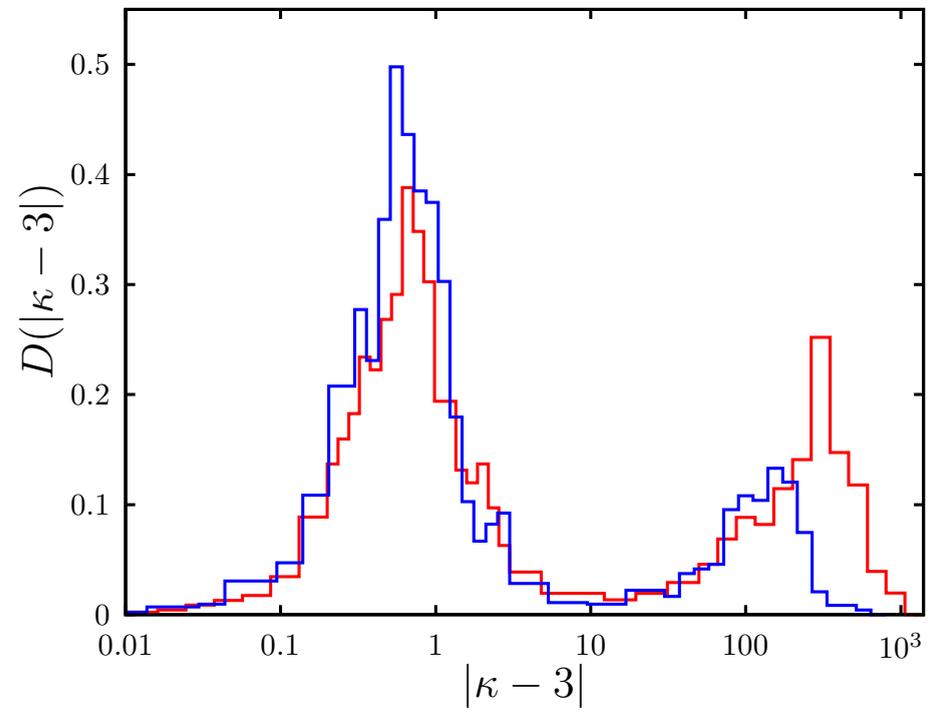
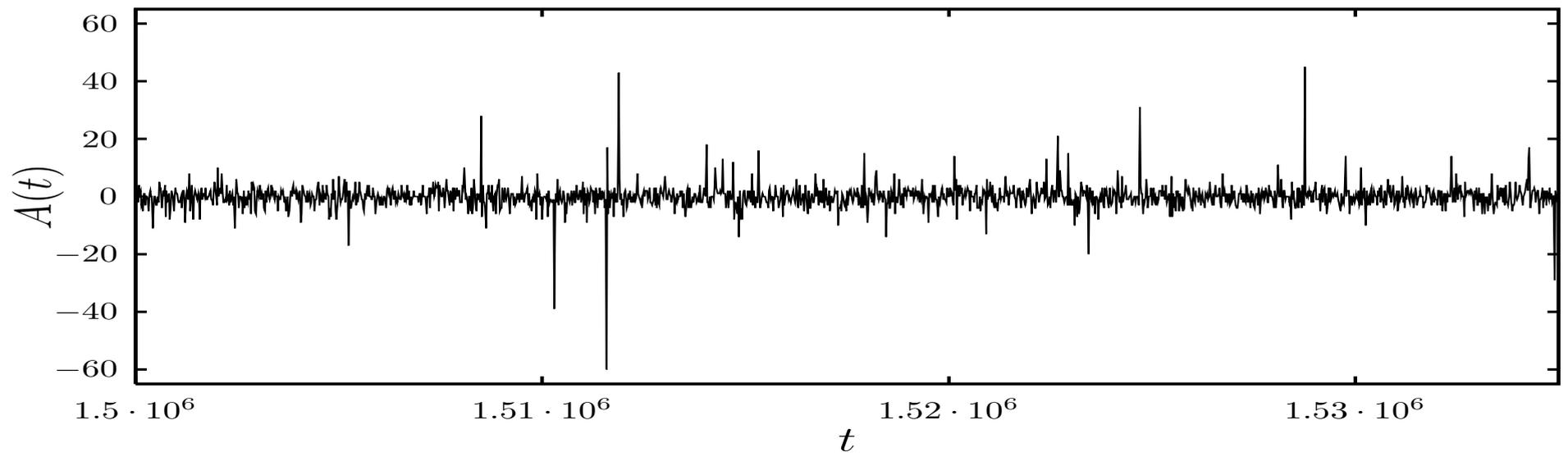
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## Social organization

Agents on social network imitate more successful neighbors with probability  $p$  (and pay for it)



Agents are placed on linear chain. Imitation may occur along the link

- Leaders
- Imitators
- Potential imitators
- Information flow

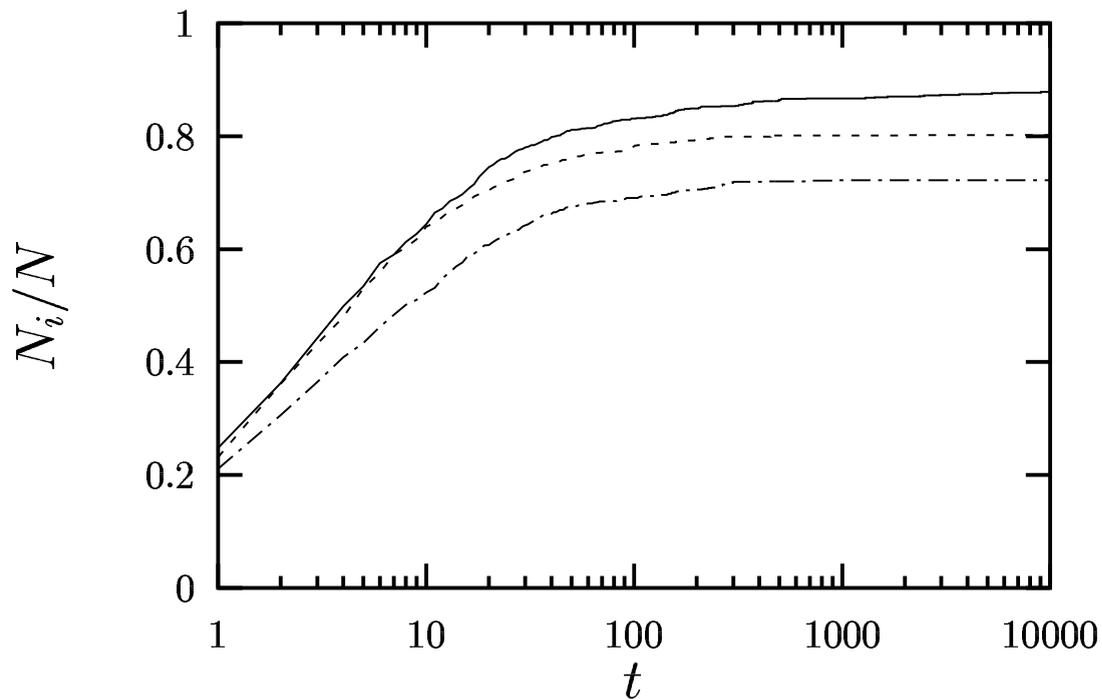


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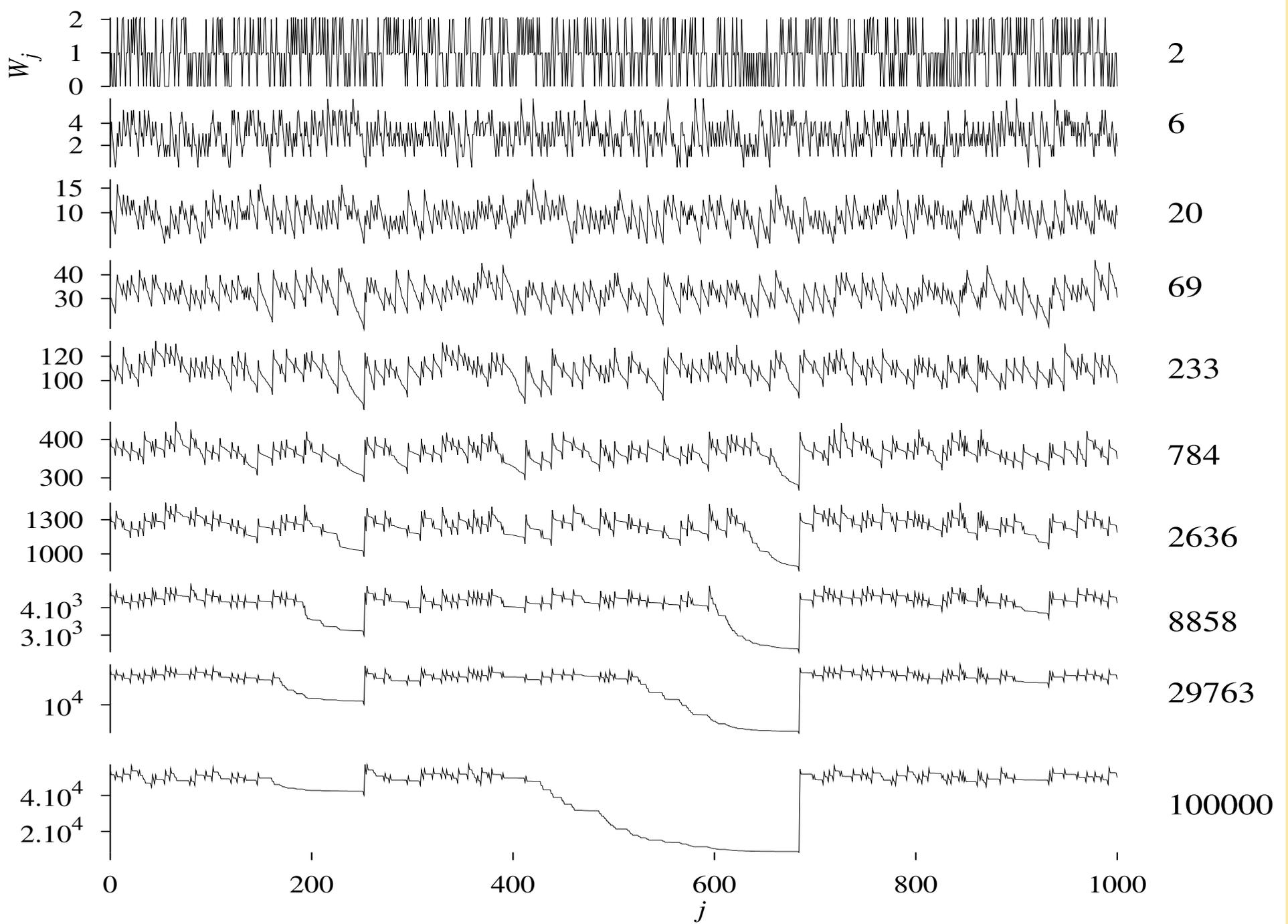
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Time dependence of imitation.  $p = 0.99$  (full line)  
0.95 (dashed), 0.8 (dash-dotted)

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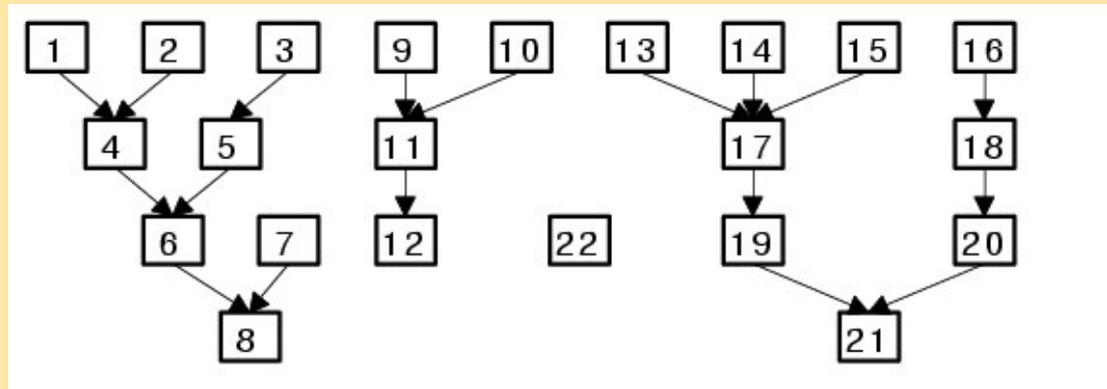


poverty islands created



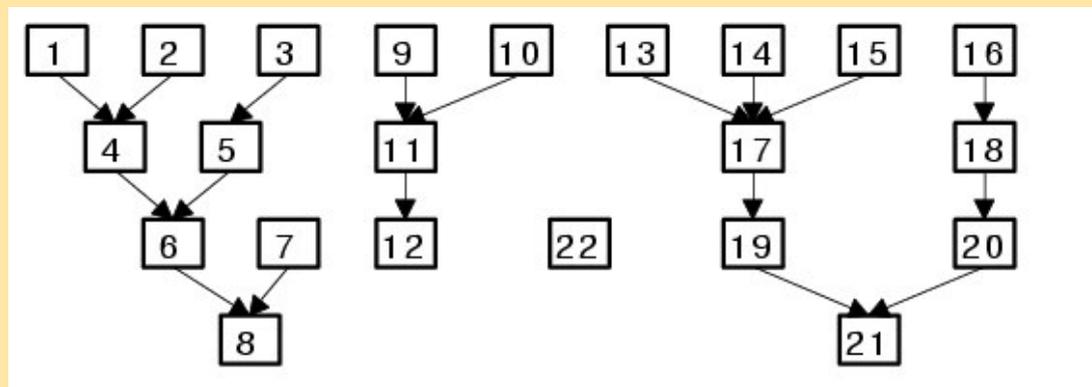
# Imitation on Barabási-Albert network [with H. Lavička]

No compact imitation clusters, rather tree-like structures:

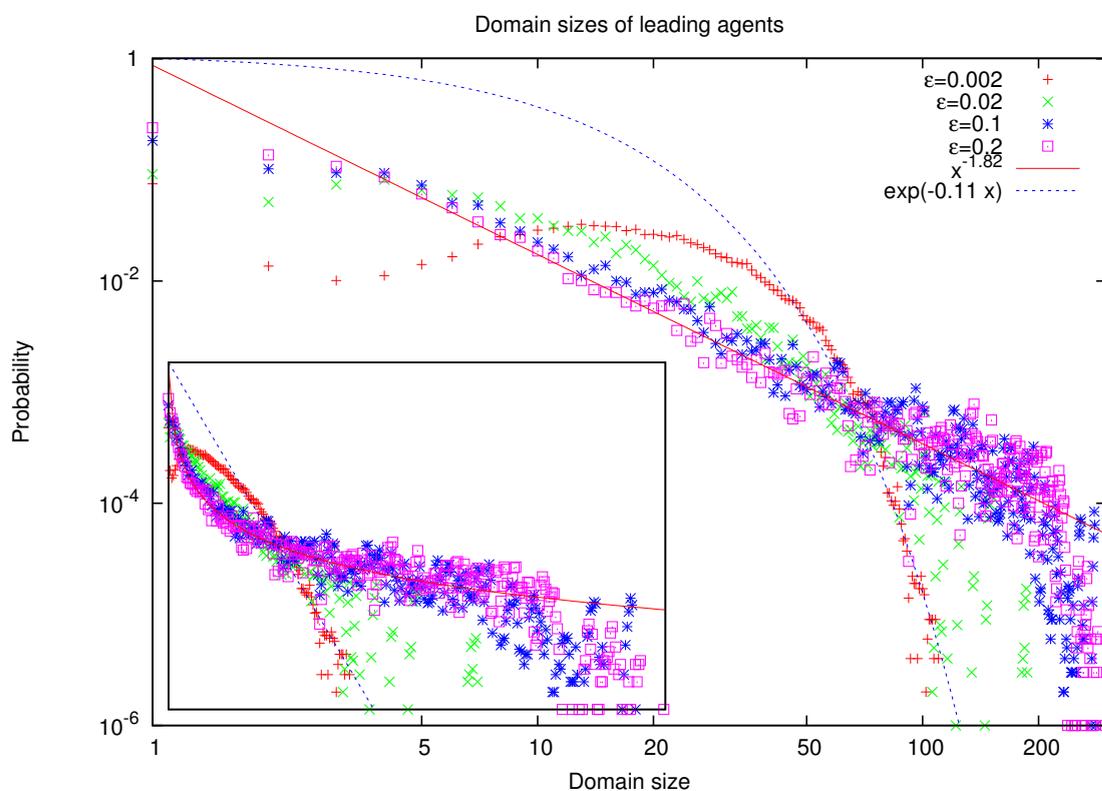


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Domain-size statistics:

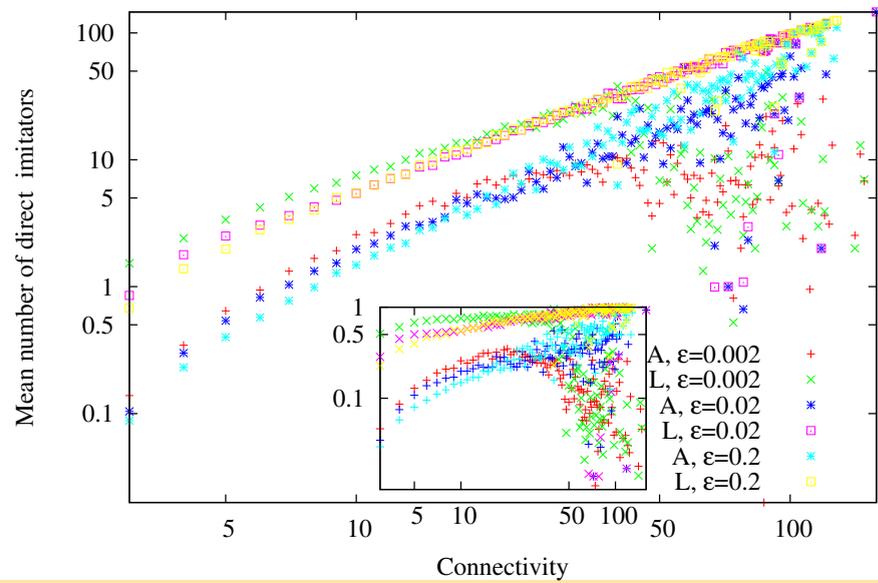


low fee: exponential  
high fee: power-law



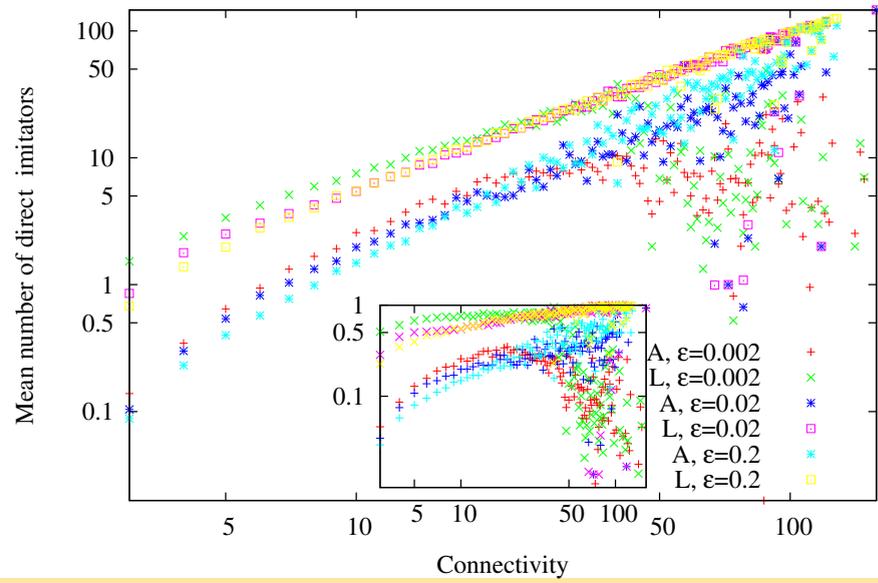
# Forking:

Correlation of number of imitators and connectivity

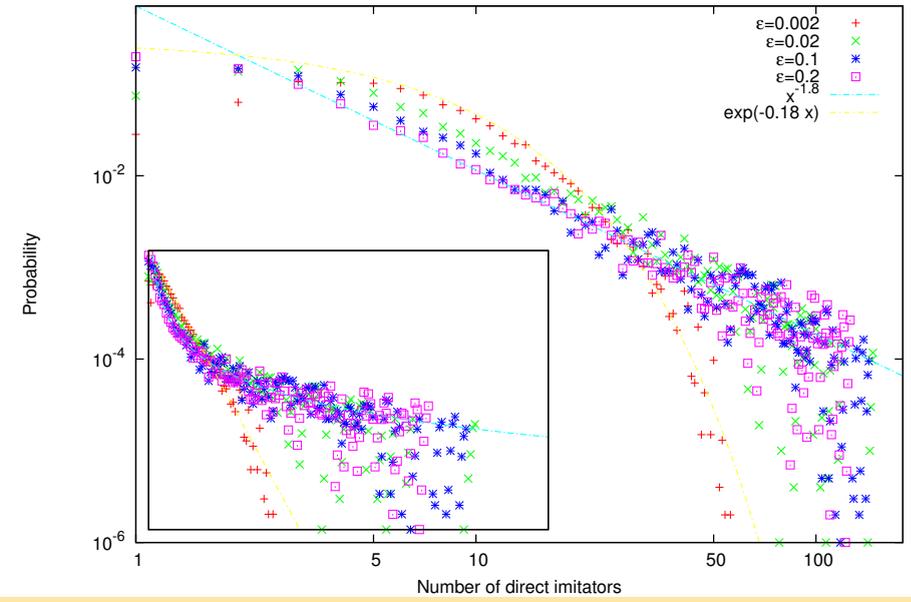


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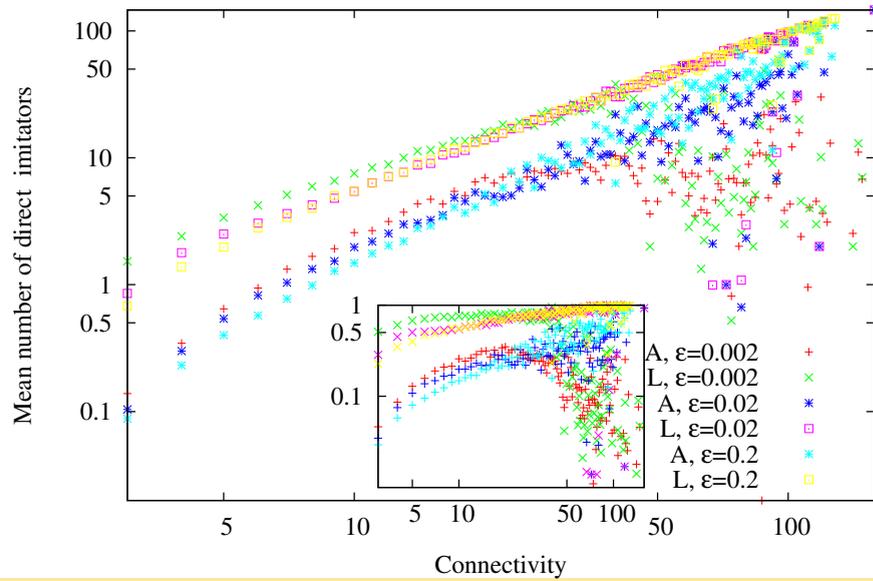


Forking leading agents

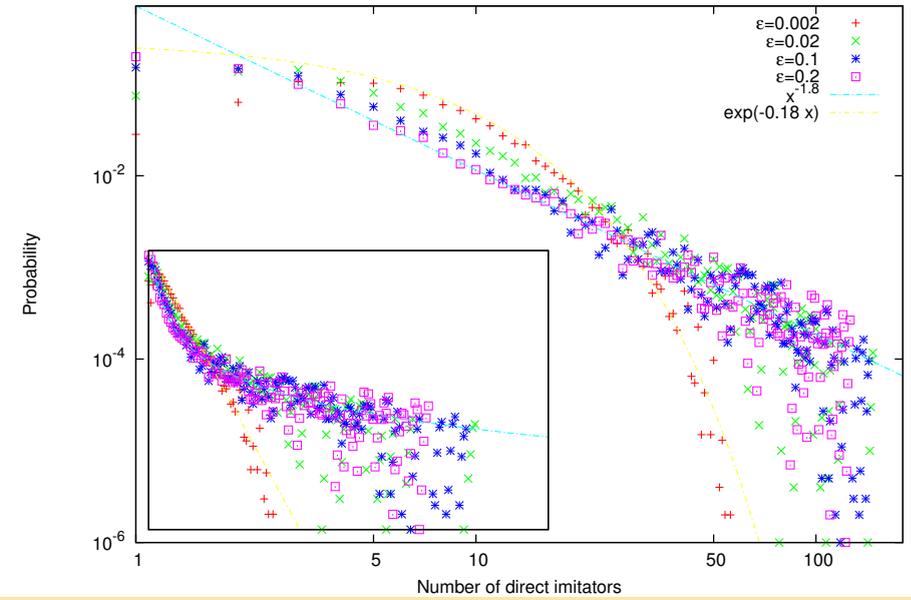


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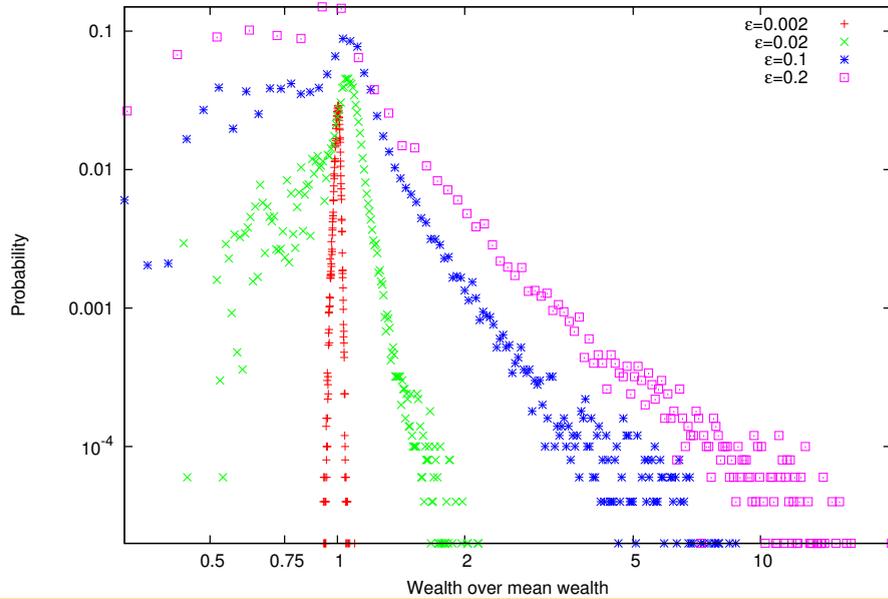


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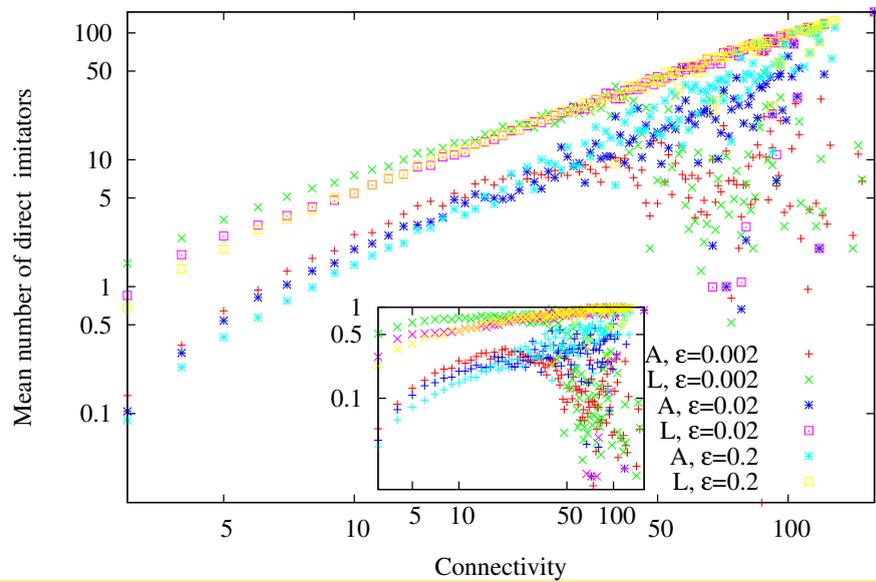
# Wealth distribution:

Points distribution

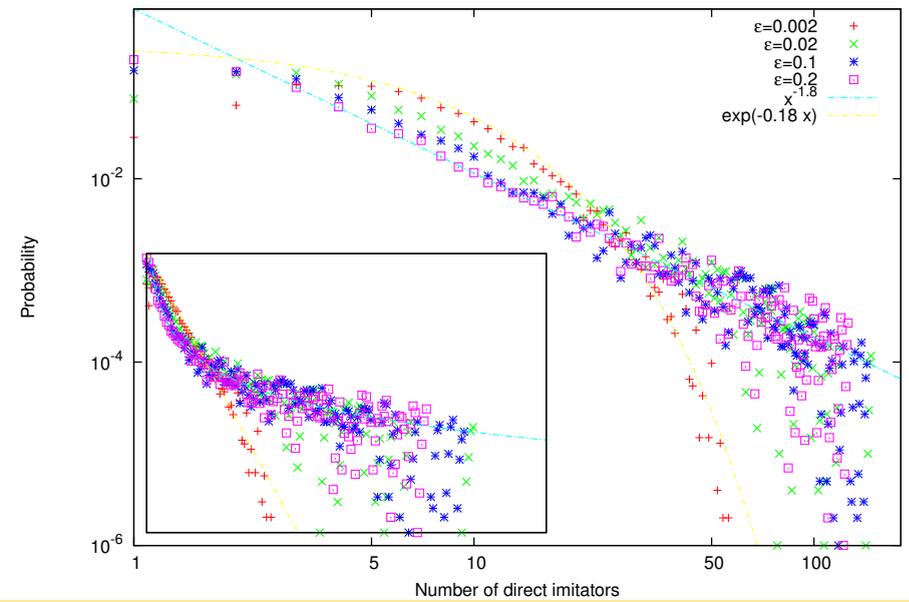


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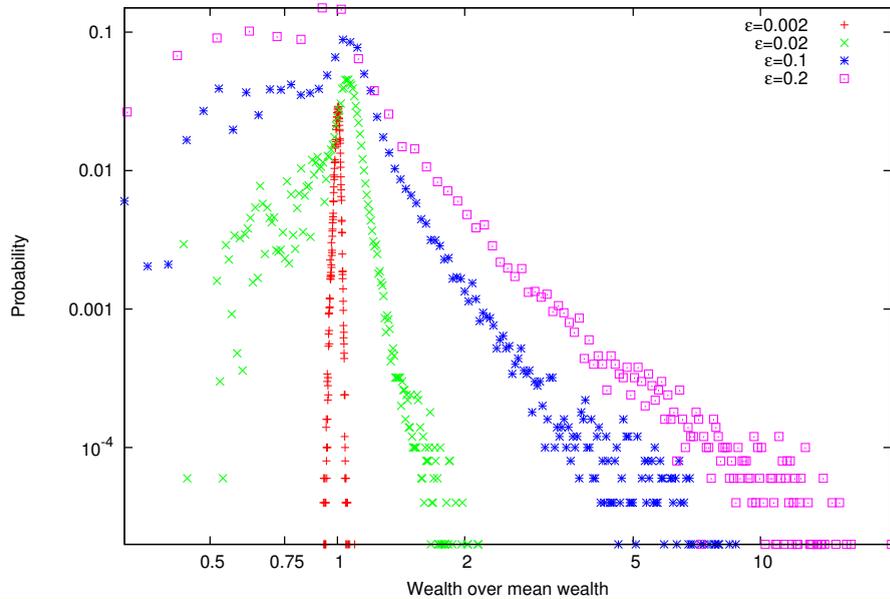


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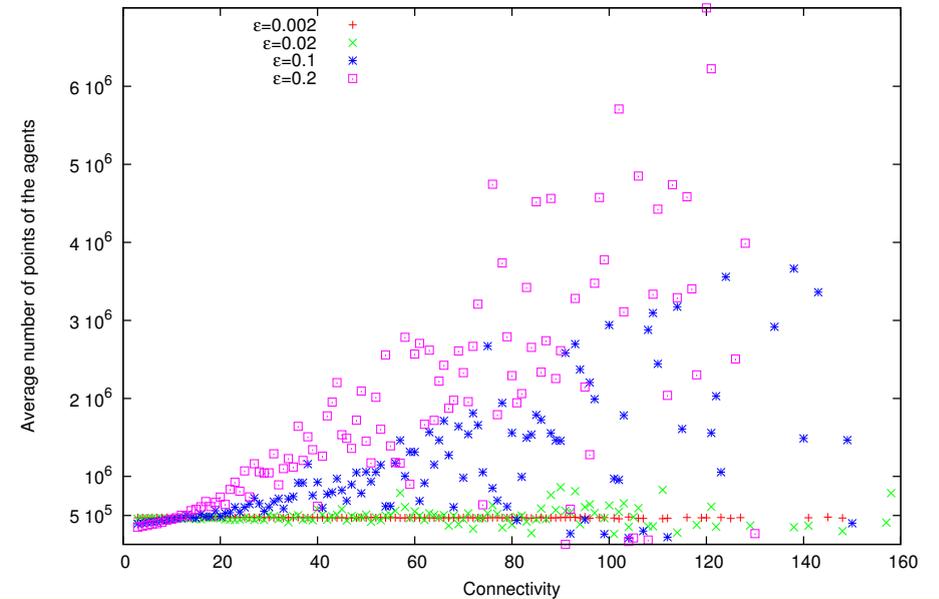


# Wealth distribution:

Points distribution



Mean points per connectivity after 10<sup>6</sup> timesteps



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Motivation: global versus fragmented culture (language etc.)



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Update step: one of the different features over active bond set equal.



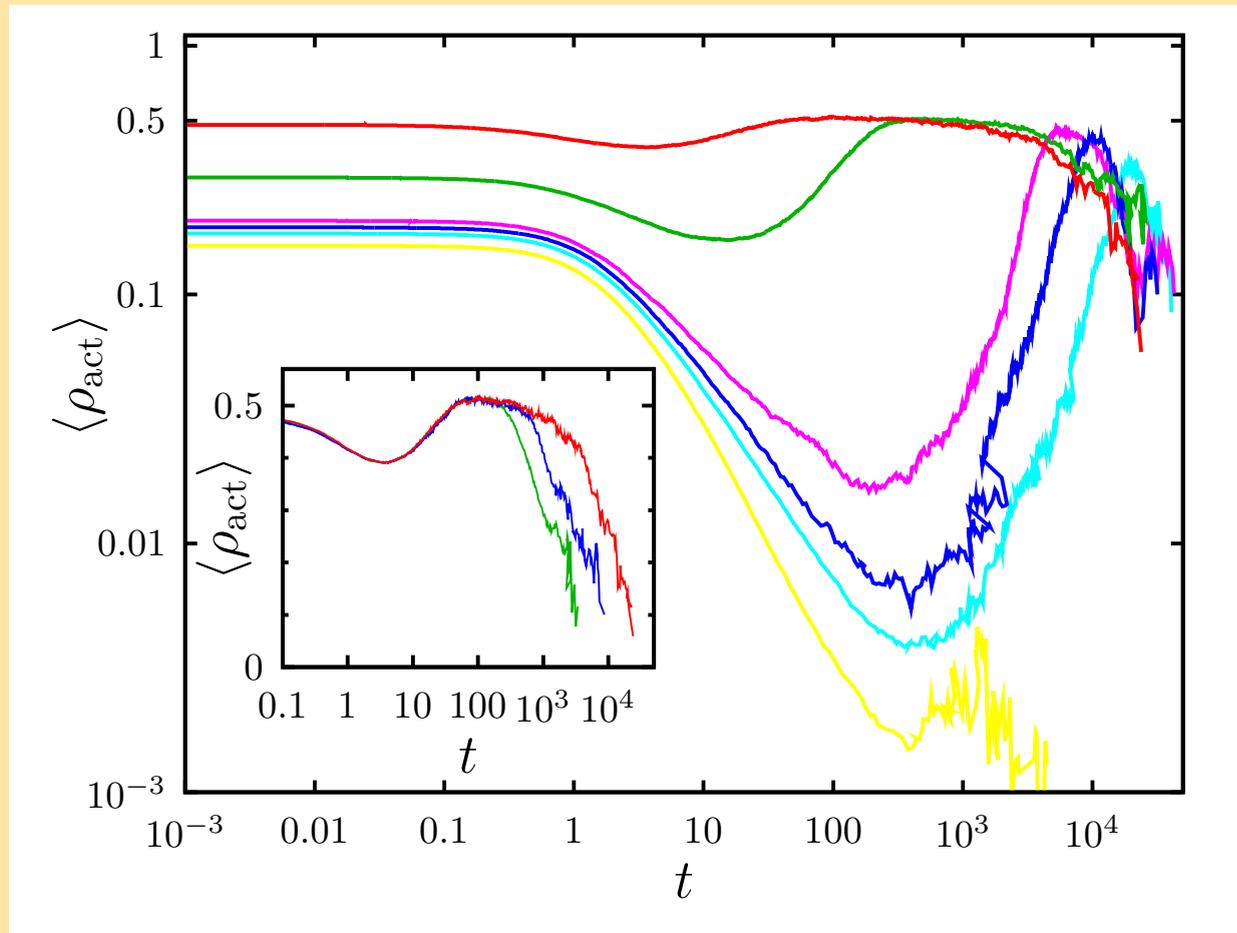
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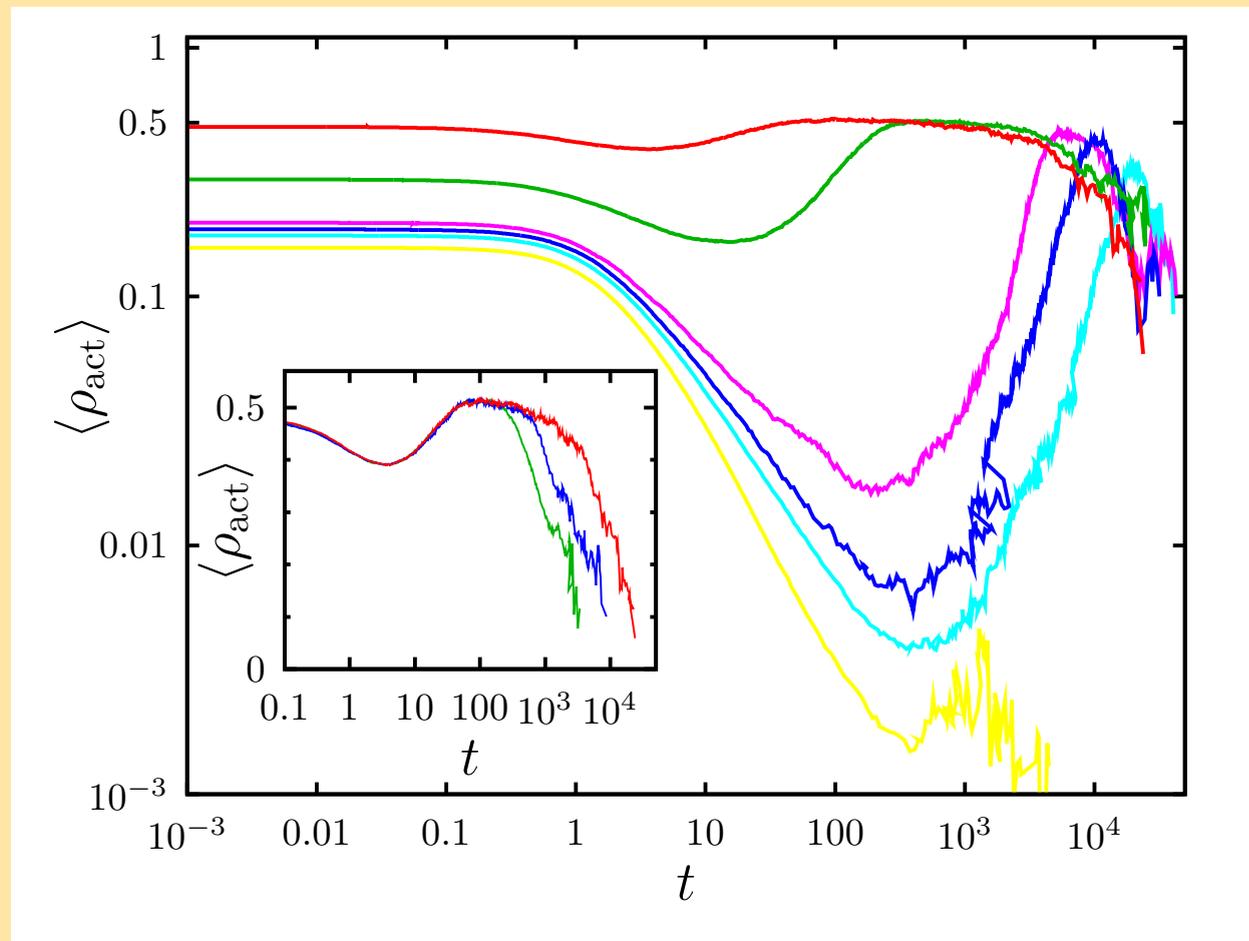
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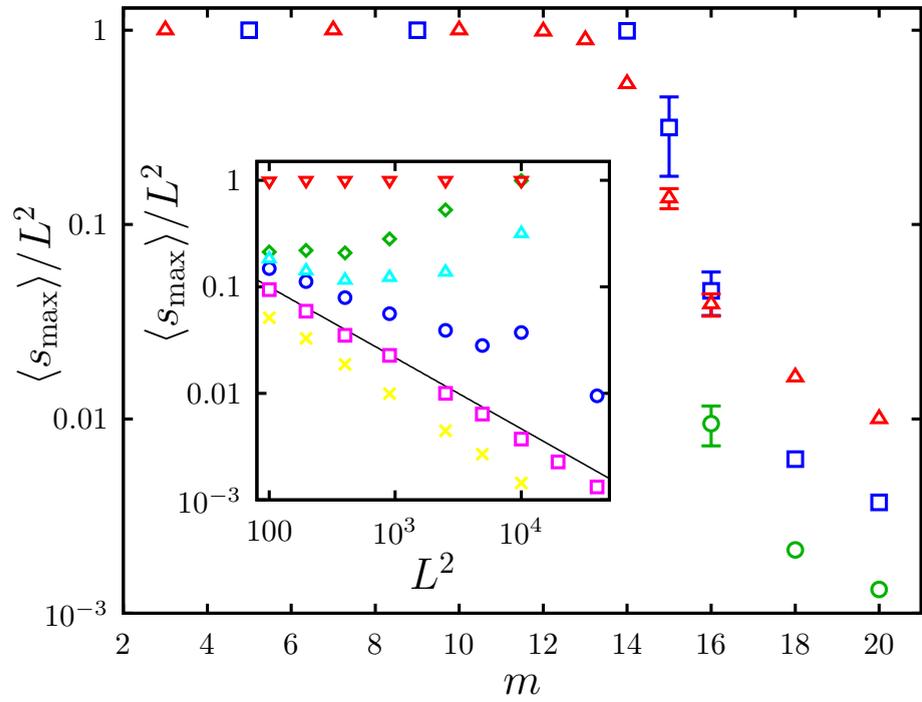
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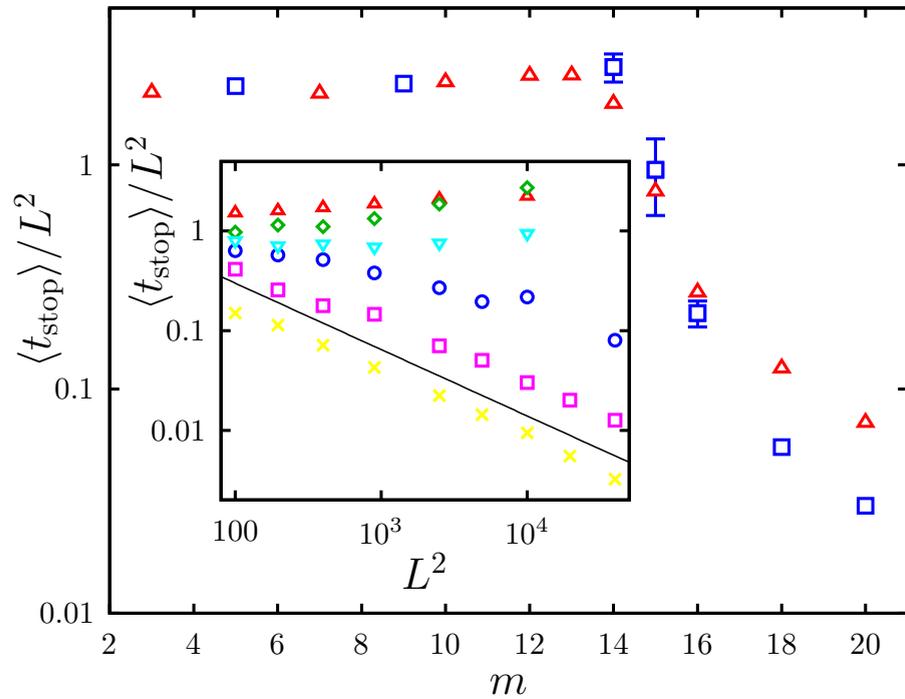
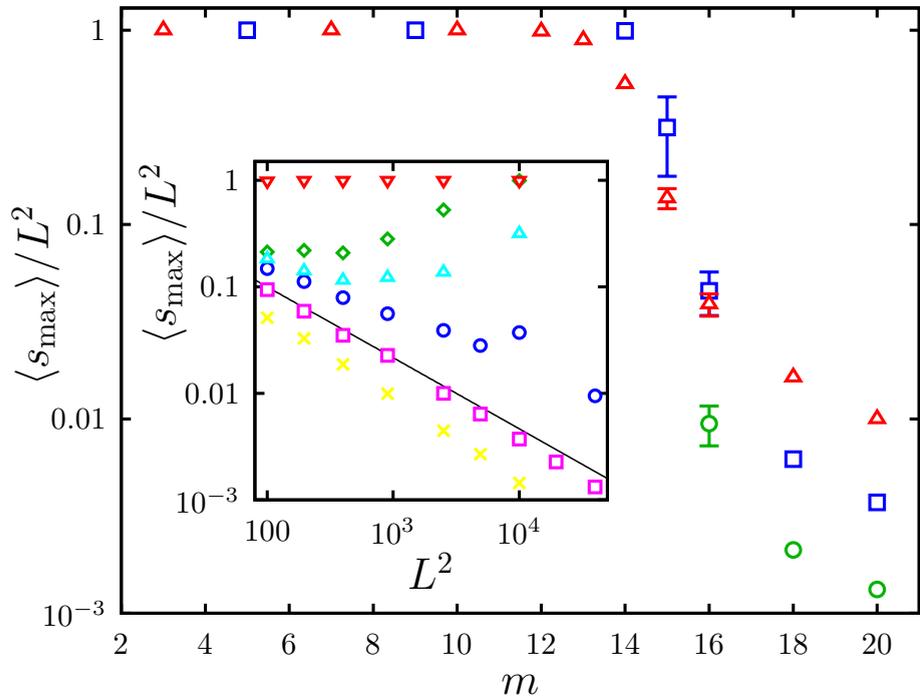
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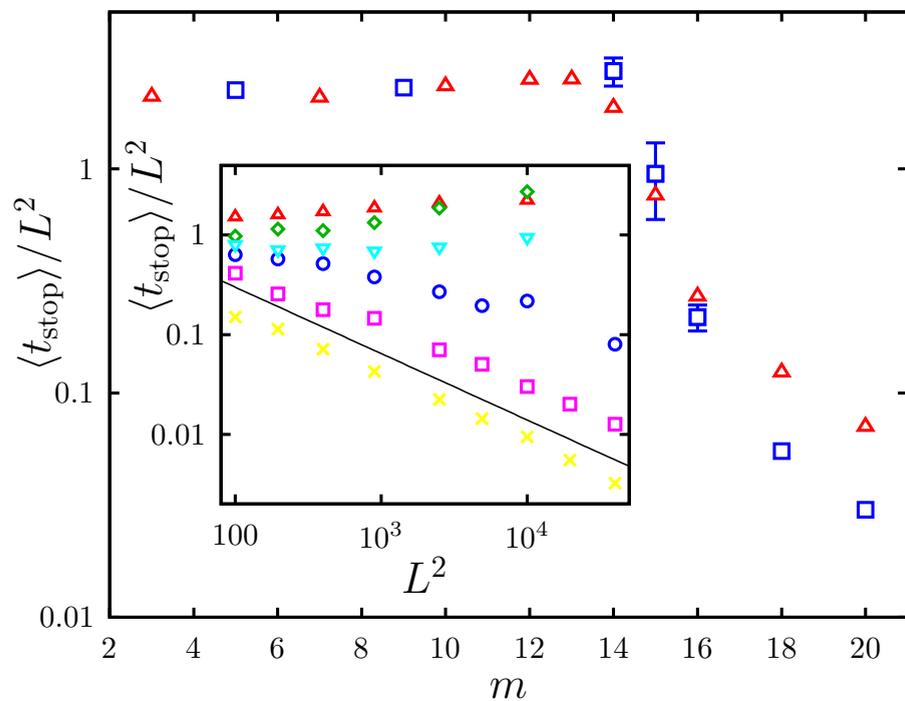
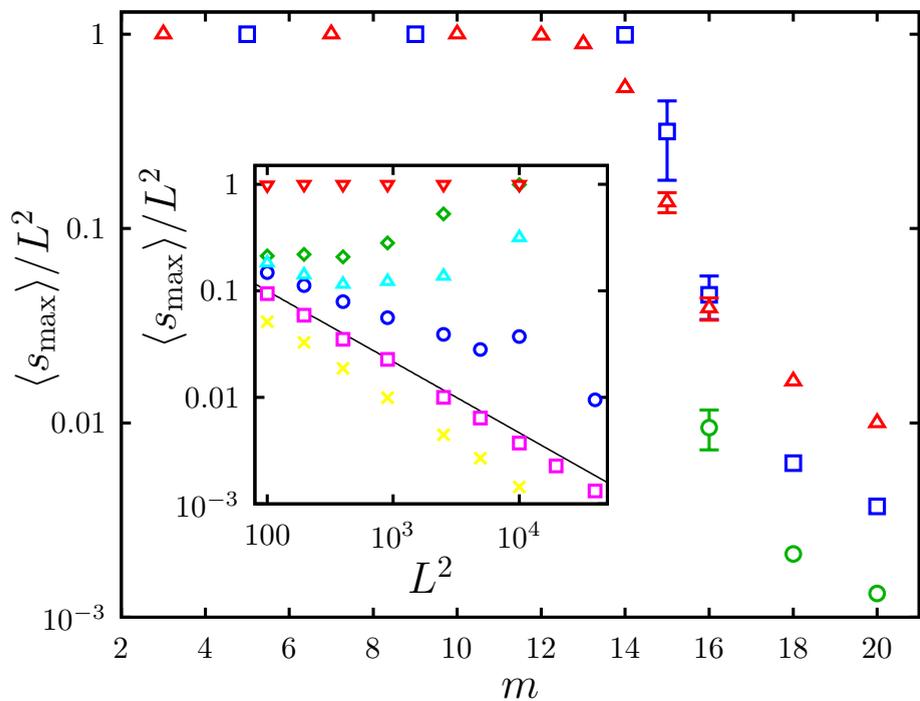
$F = 3$



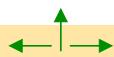
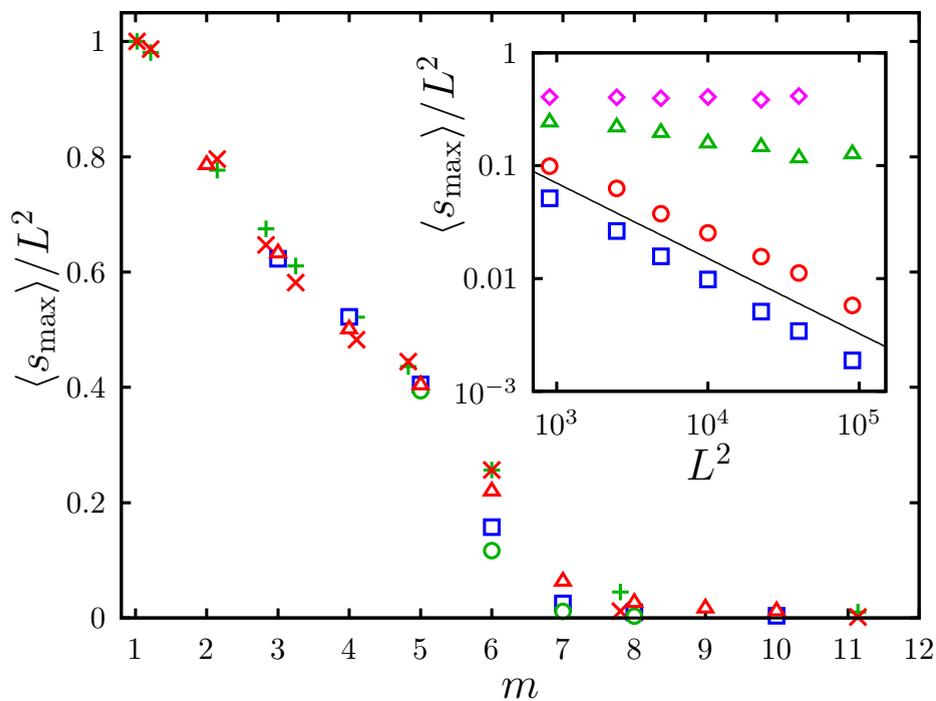
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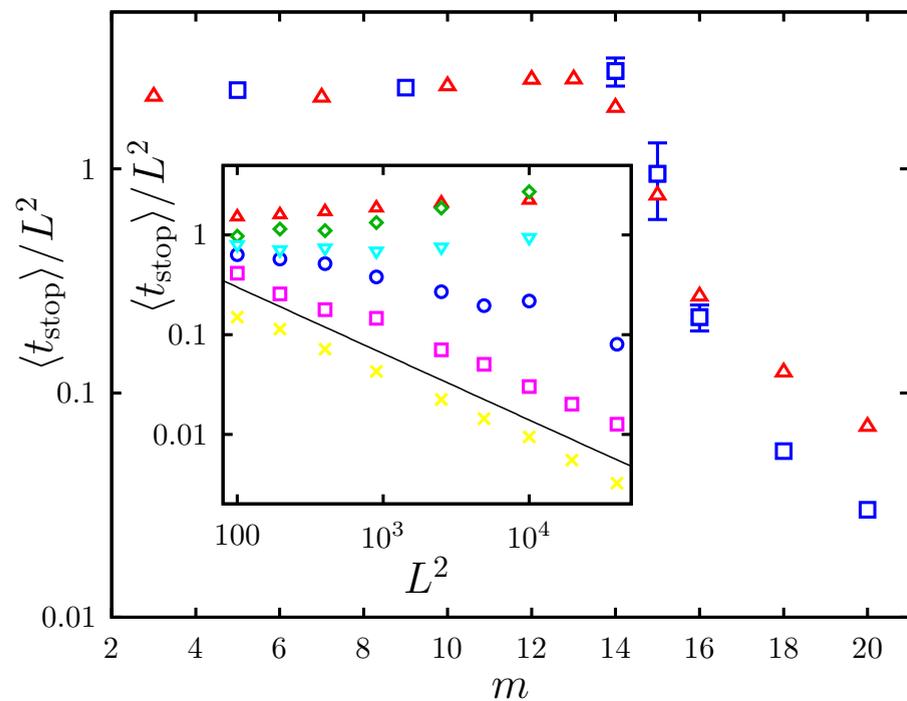
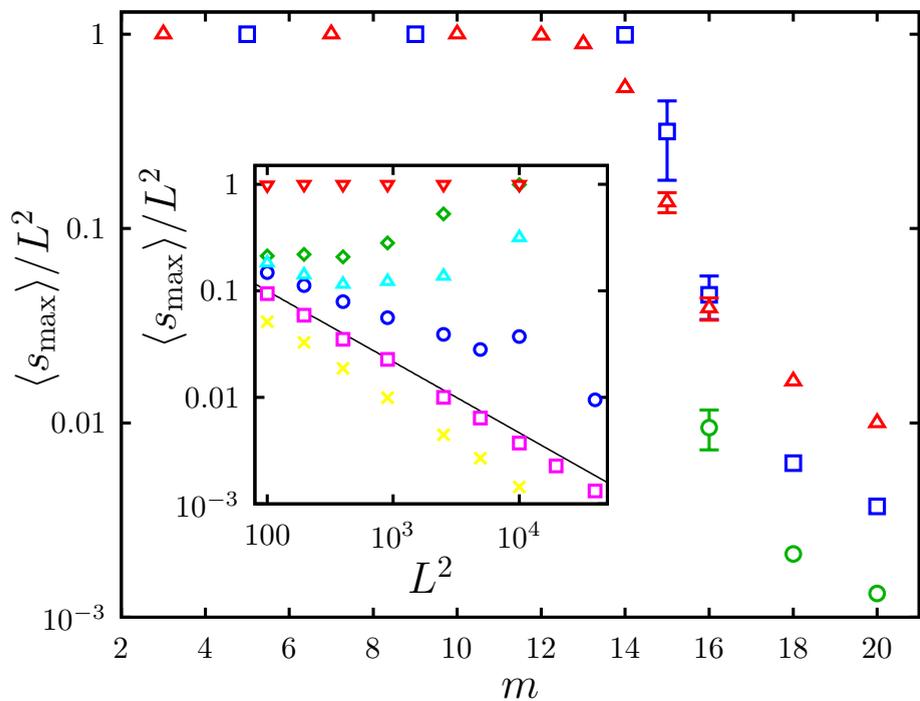
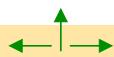
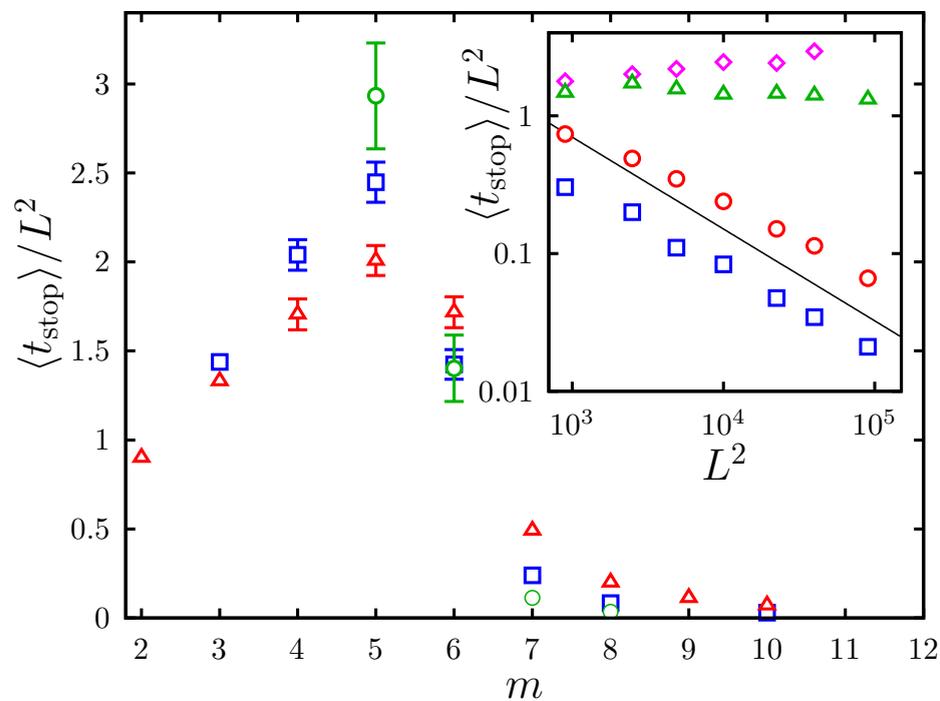
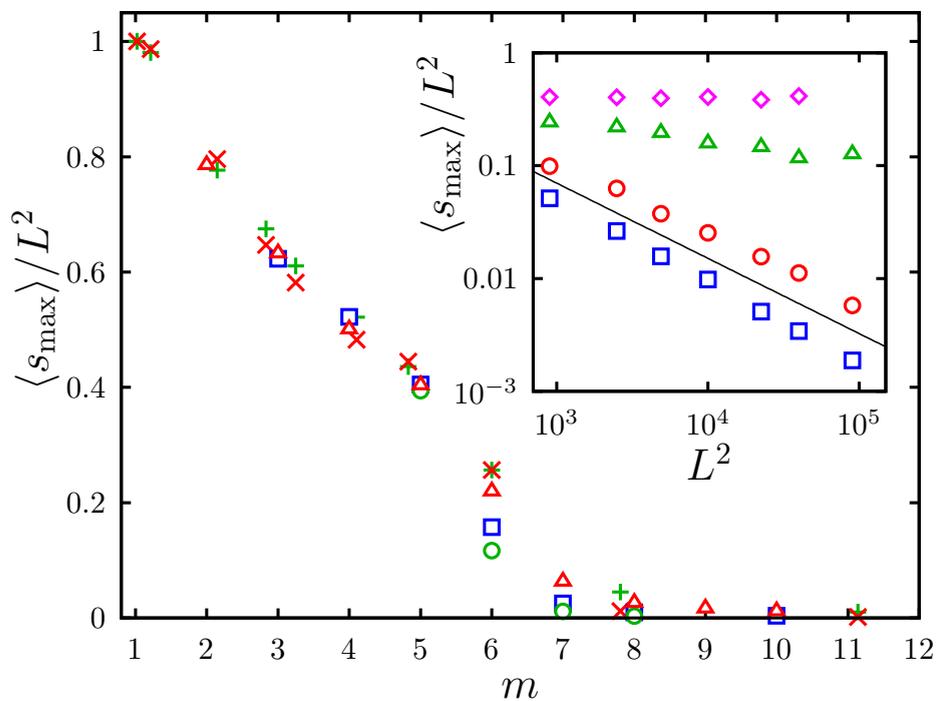


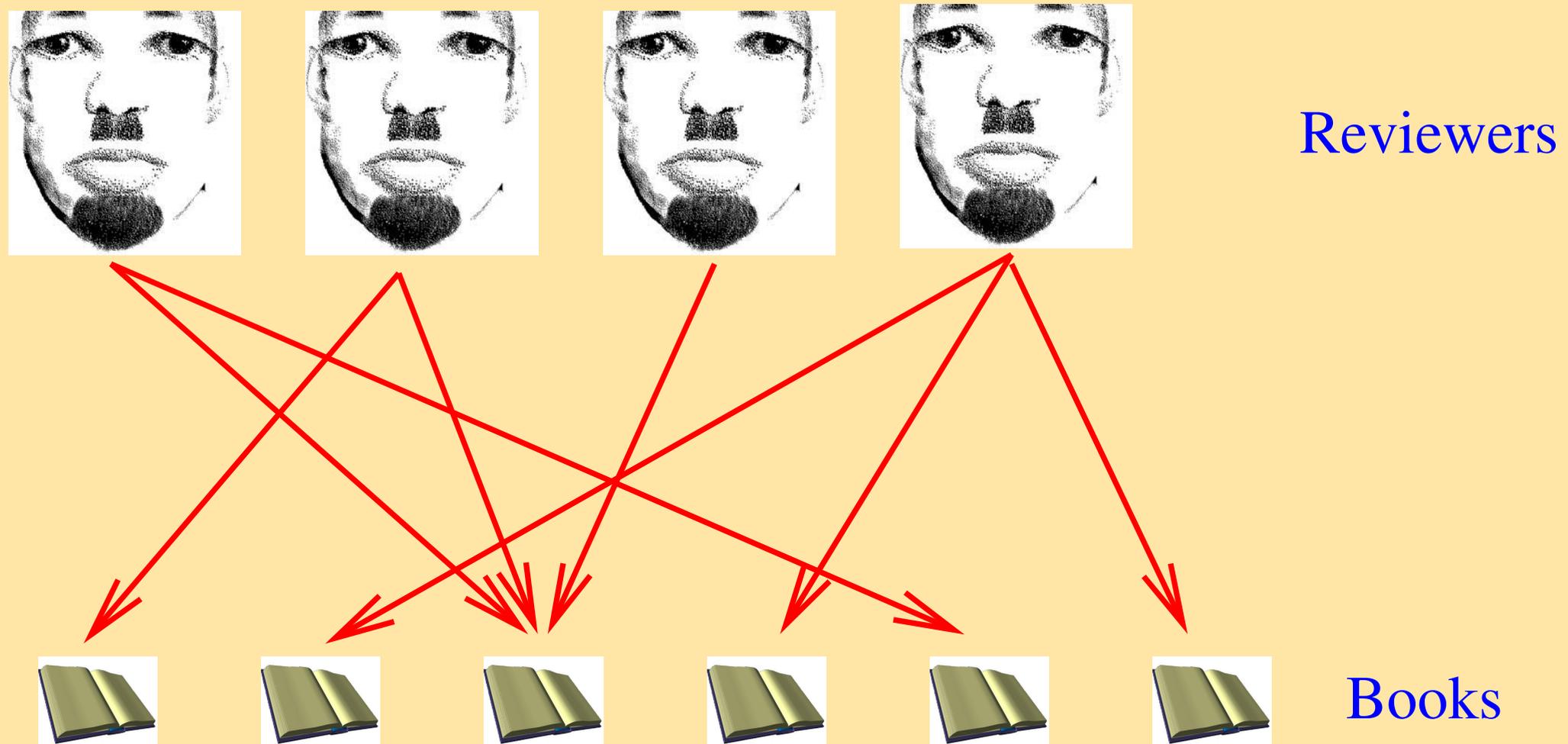
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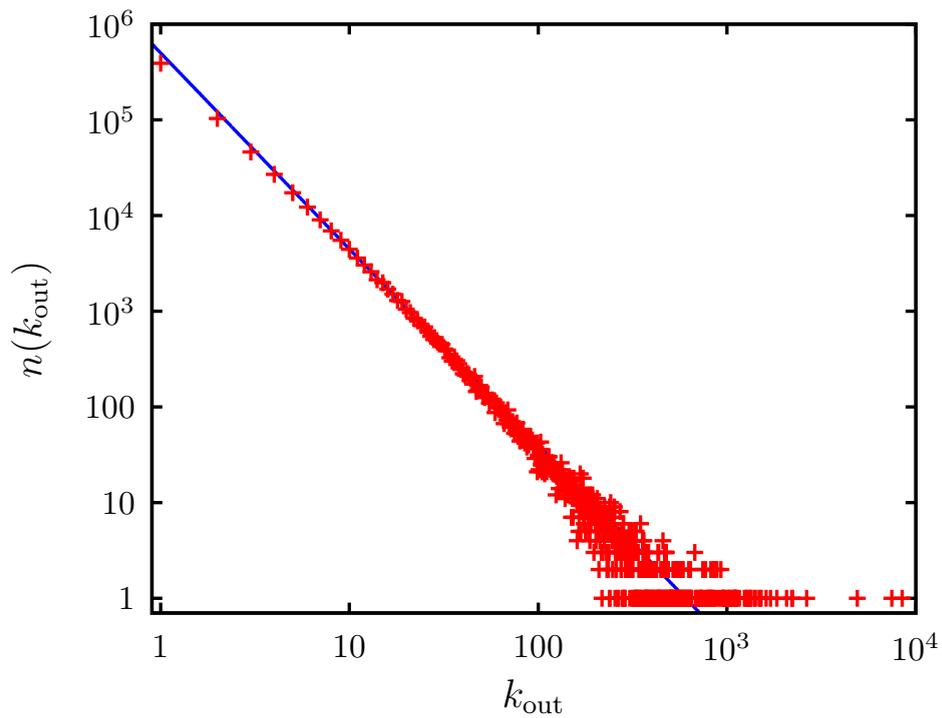
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- Write a robot to download reviews automatically
- Statistics of the network
- Spectral properties of the network

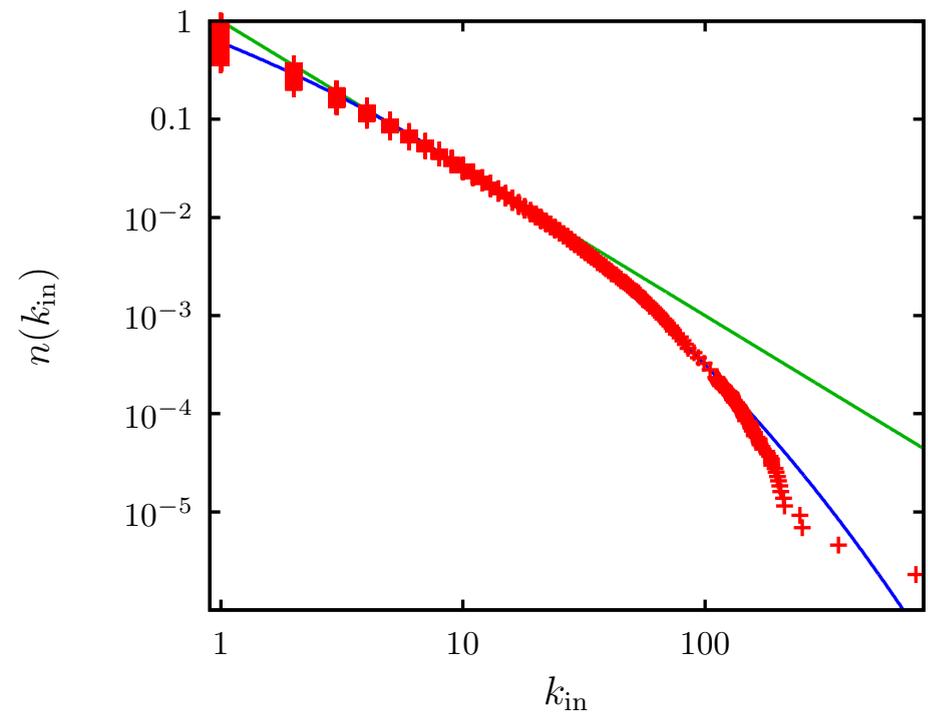


# Statistics of the network



Distribution of books per reviewer.

Line:  $k_{\text{out}}^{-\gamma}$ ,  $\gamma = 2.05$ .



Distribution of reviewers per book.

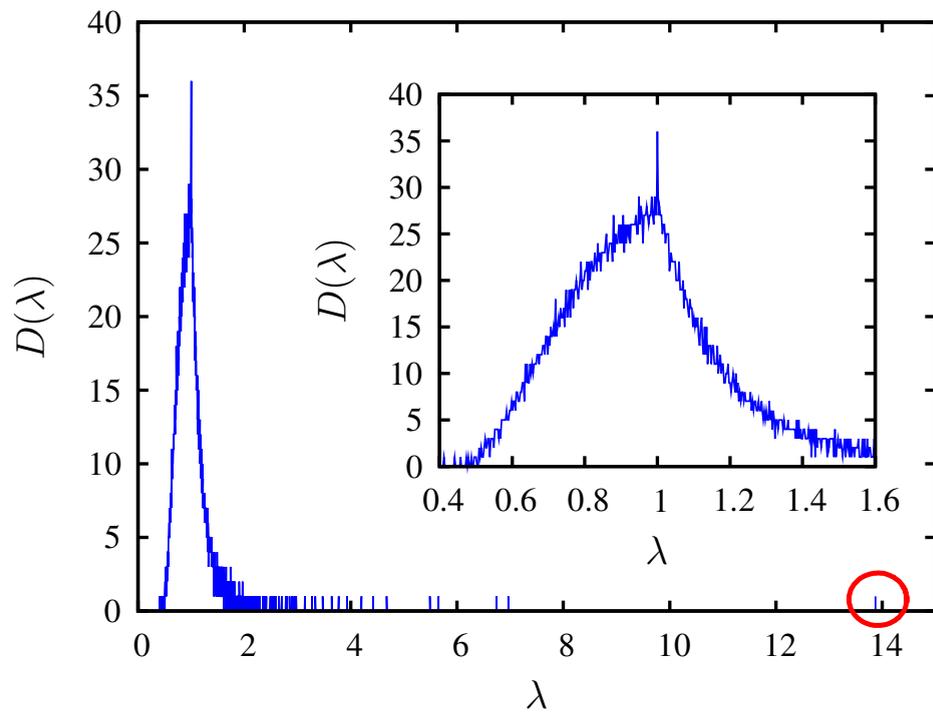
Green line:  $k_{\text{in}}^{-\gamma}$ ,  $\gamma = 1.5$ .

Blue line:  $\exp(-5 k_{\text{in}}^{0.2})$



# Spectral properties of the network ( $5000 \times 5000$ subnet)

$M_{br} = 1$  if  $r$  reviews book  $b$ .  $A = M^T M$  describes indirect interaction between reviewers.



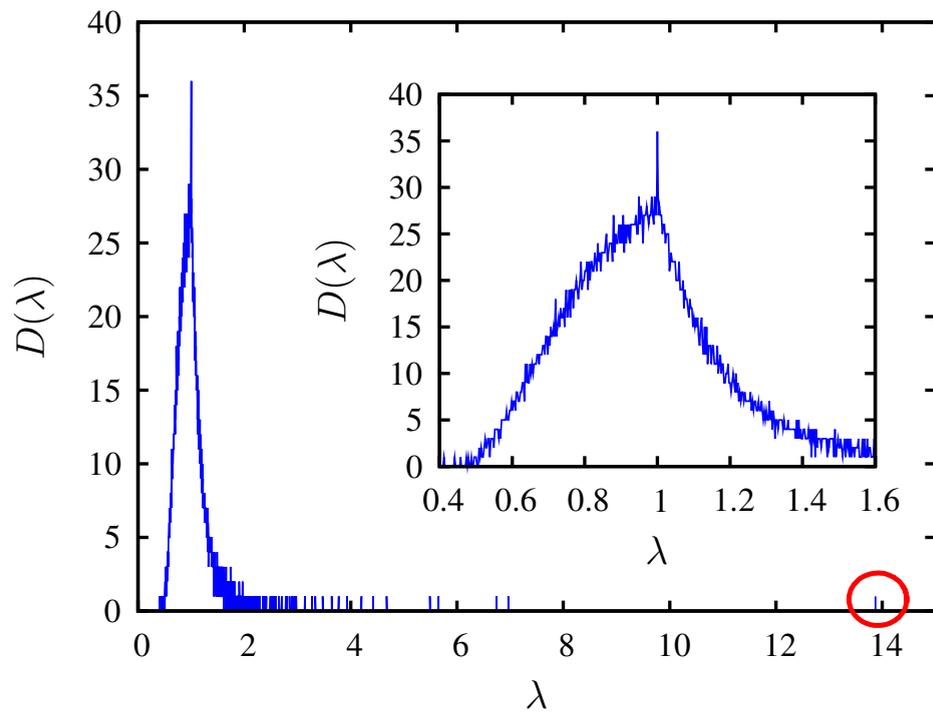
Histogram of eigenvalues of  $A$

Inset: detail of the central part. Red circle: largest eigenvalue.



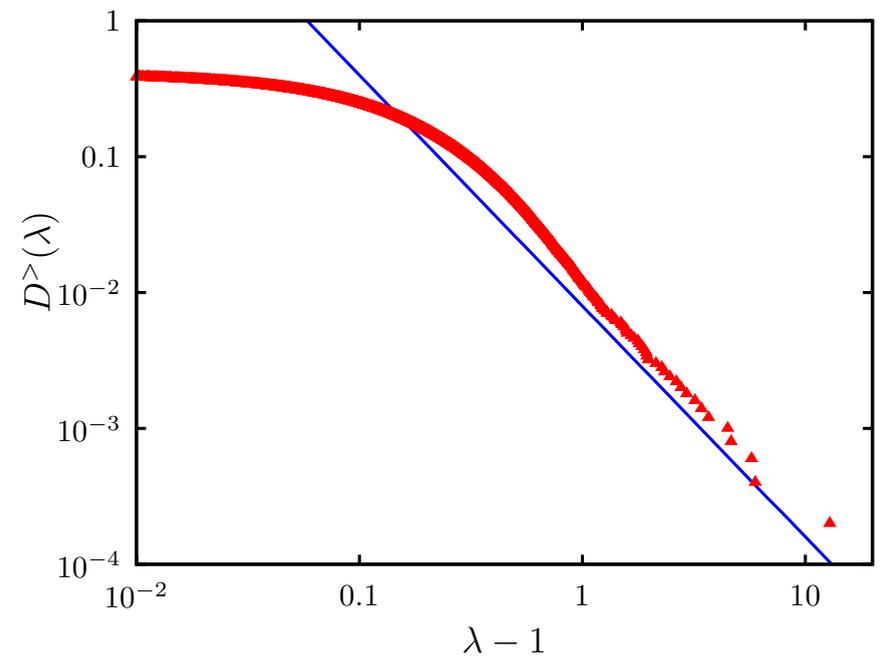
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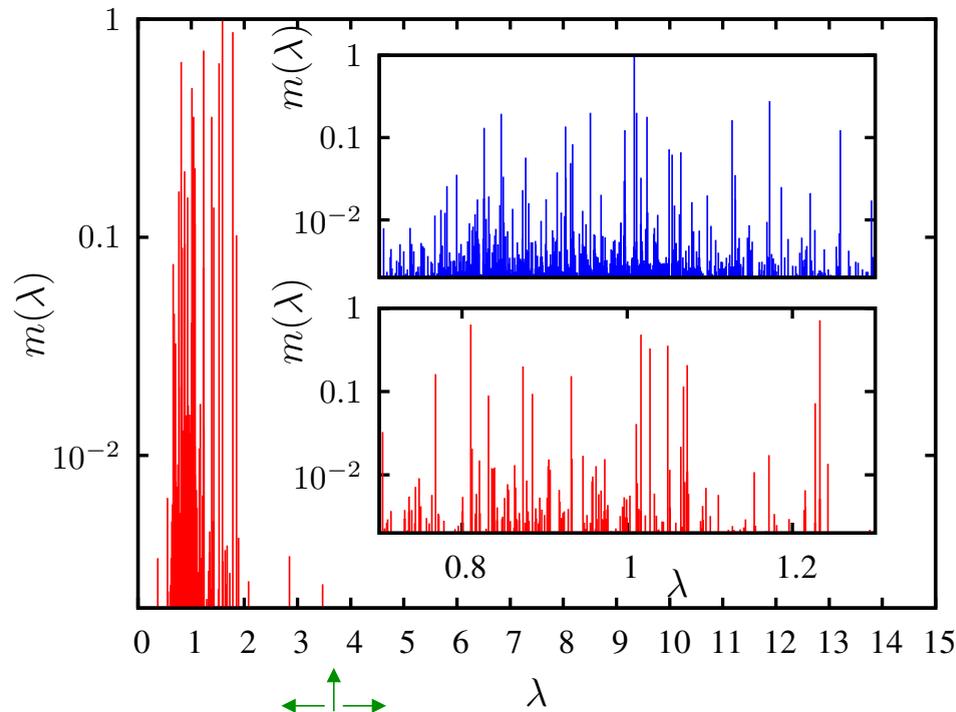
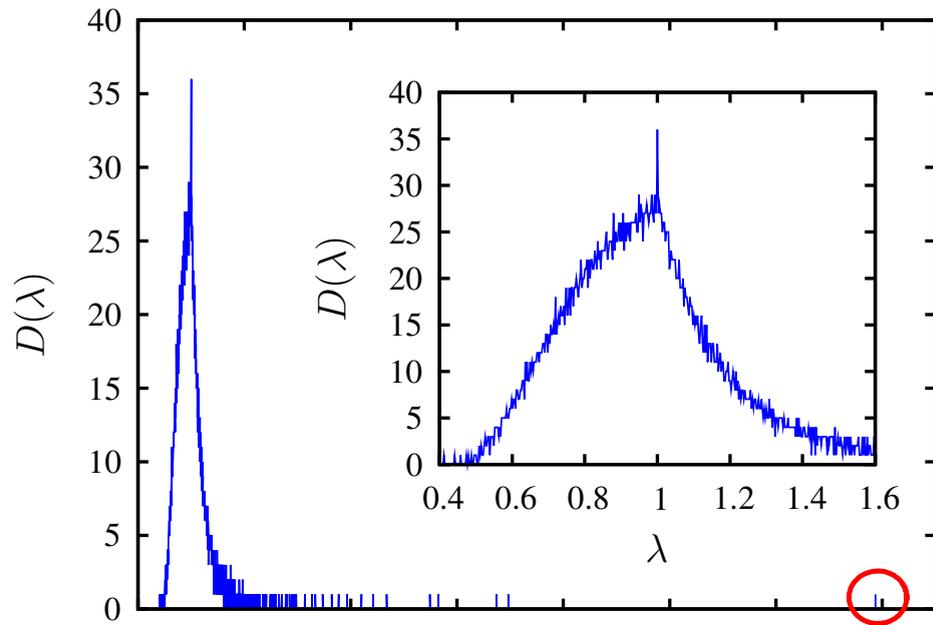
Right tail of the integrated density of states.

Line:  $(\lambda - 1)^{-\gamma}$ ,  $\gamma = 1.7$ .



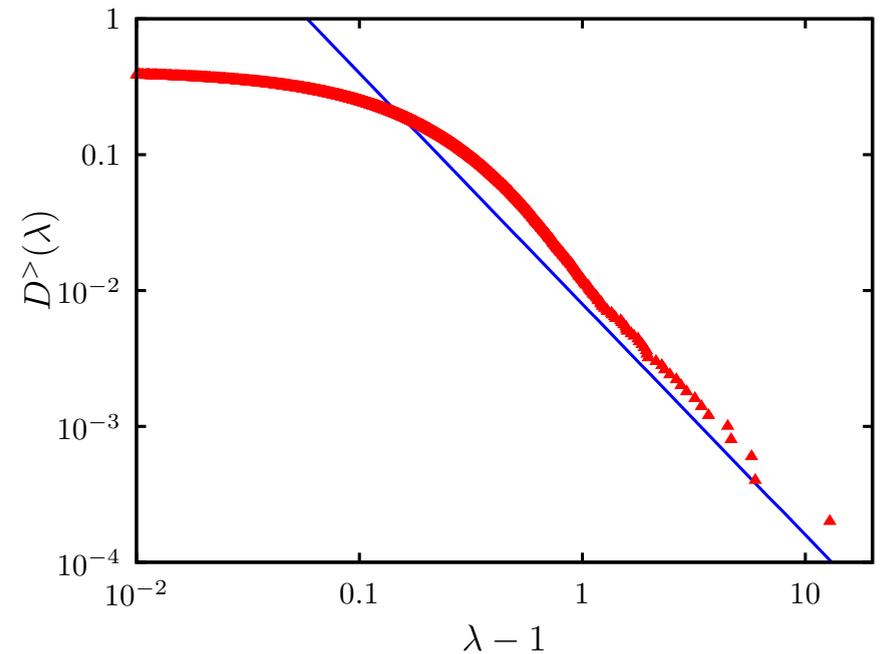
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Inverse participation ratio  $m(\lambda) = \sum_i v_{i\lambda}^4$ .

Inset: detail for  $N_r = 5000$  (red) and  $N_r = 2000$  (blue).

Compare to RM

# Conclusions



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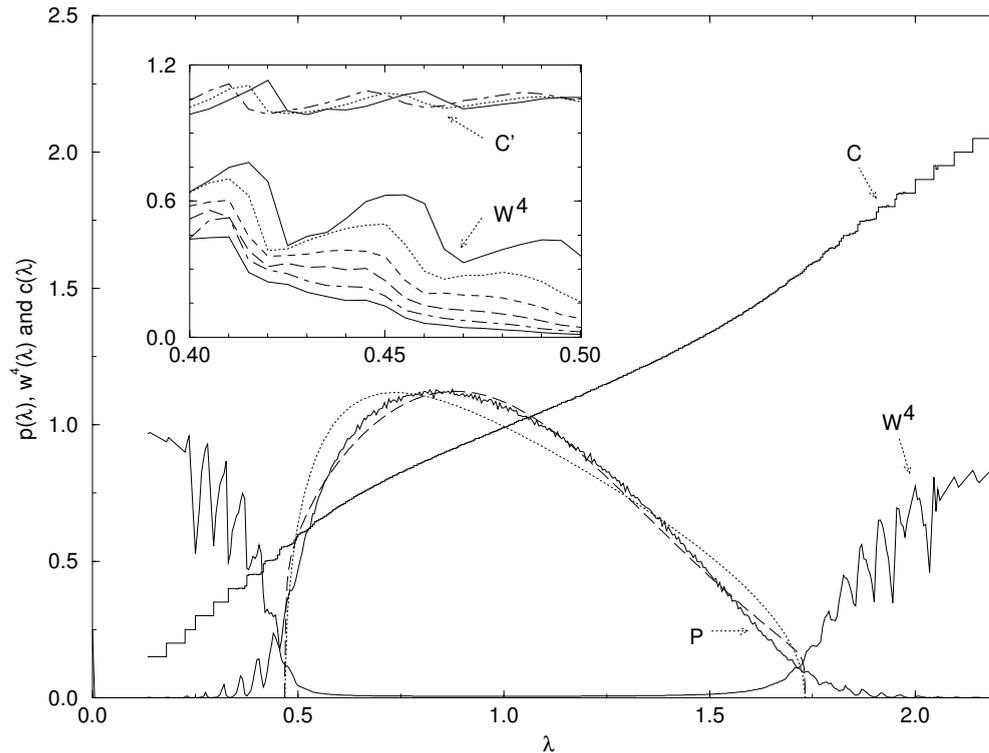
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- Thanks to collaborators: Y.-C. Zhang, H. Lavička



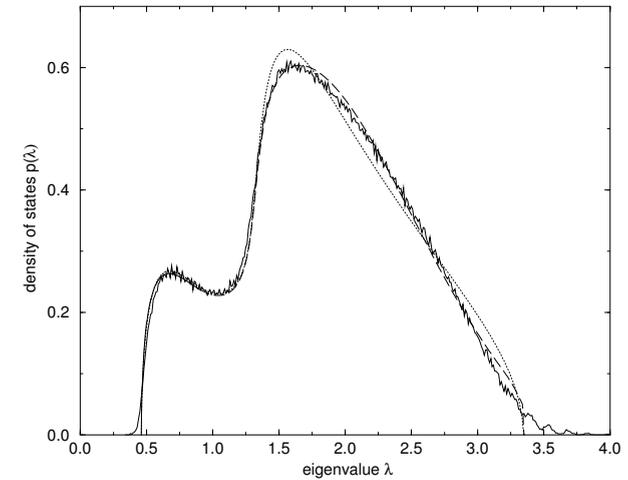
# Spectra

[G. Biroli, R. Monasson, *J. Phys. A: Math. Gen.* **32**, L255 (1999);  
R. Monasson, *Eur. Phys. J. B* **12**, 555 (1999).]

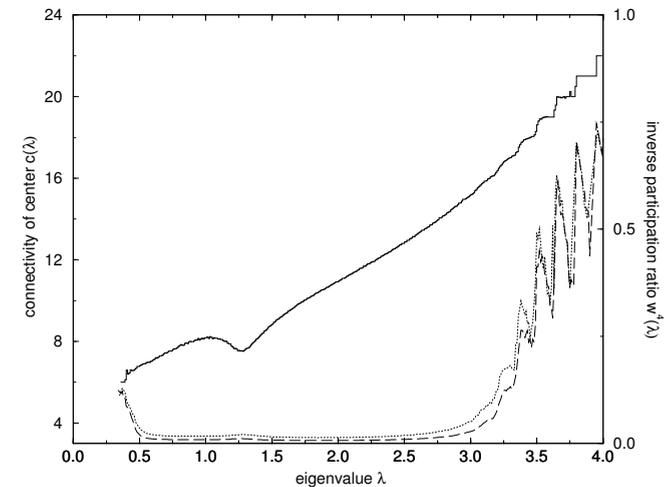


Random network.

Density of states  $p(\lambda)$ , inverse participation ratio  $w^4(\lambda)$   
and connectivity of the centers  $c(\lambda)$  (divided by  $q$ )  
averaged over 2000 samples for  $q = 20$ ,  $N = 800$ .



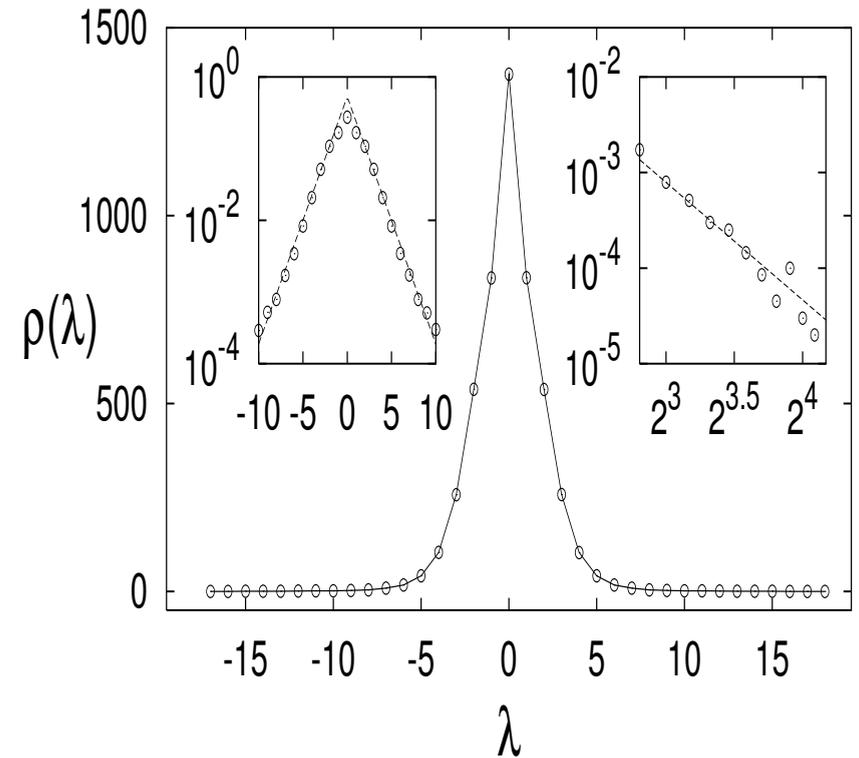
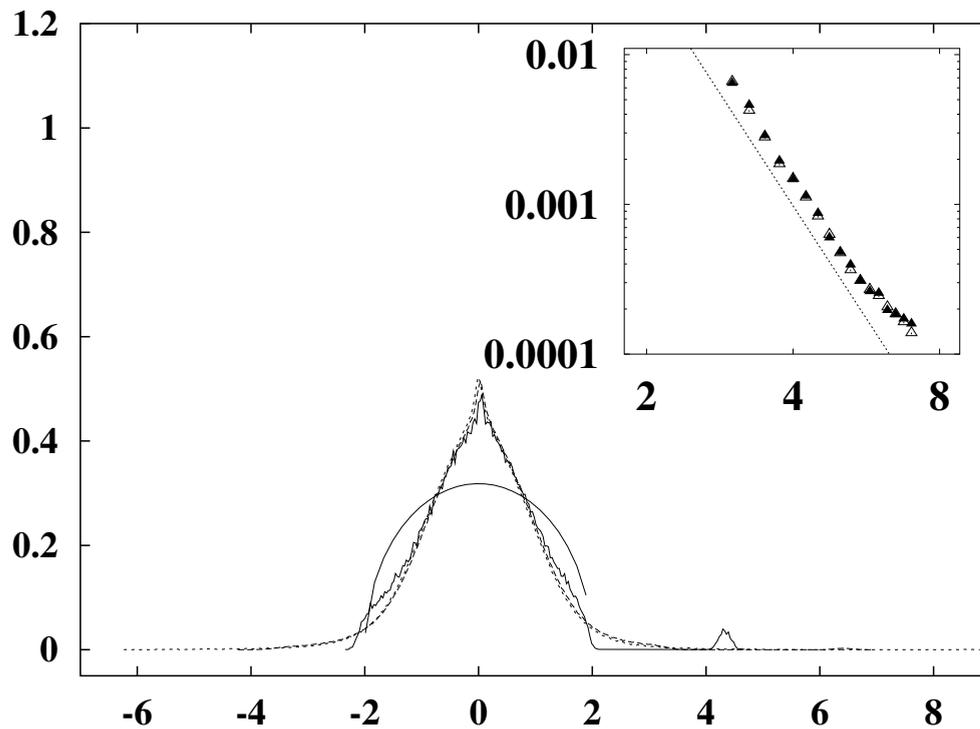
Small-world network  $K = 3$ ,  $q = 5$ .  
Density of states from numerics,  
EMA and SDA approximation.



Inverse participation ratio for  $N = 256$   
and  $N = 512$  averaged over 1000 samples.

# Scale-free networks

[Illes J. Farkas, Imre Derenyi, Albert-Laszlo Barabasi, Tamas Vicsek, *Physical Review E* **64**, 026704 (2001); K.-I. Goh, B. Kahng, and D. Kim, *Phys. Rev. E* **64**, 051903 (2001); S. Bilke and C. Peterson, *Phys. Rev. E* **64**, 036106 (2001).]



Density of states. Power-law tail.

Density of states.

Compare to reviewer matrices

