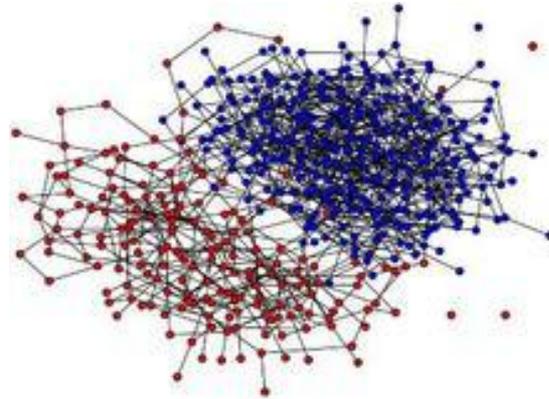


Coevolving voter model on a network – coupling of order parameters



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outline

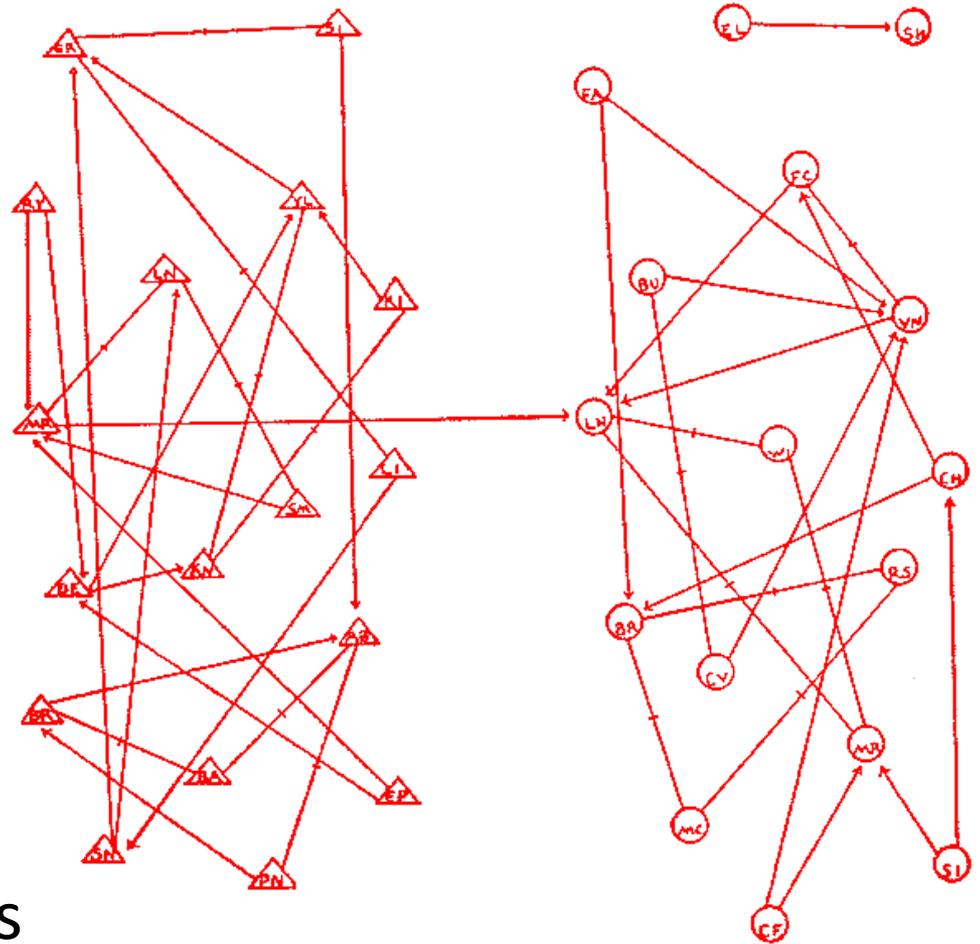
- * A quote from Jacob Moreno
- * Sociometric tests
- * What are social networks like
- * Homophily and social contagion
- * Model evolution : single events
- * Equations of motion after Vazquez et al
- * More detailed equations of motion
- * Analytical vs numerical results
- * Summary



Jacob L. Moreno (1879-1974)

1928-1933: first sociograms

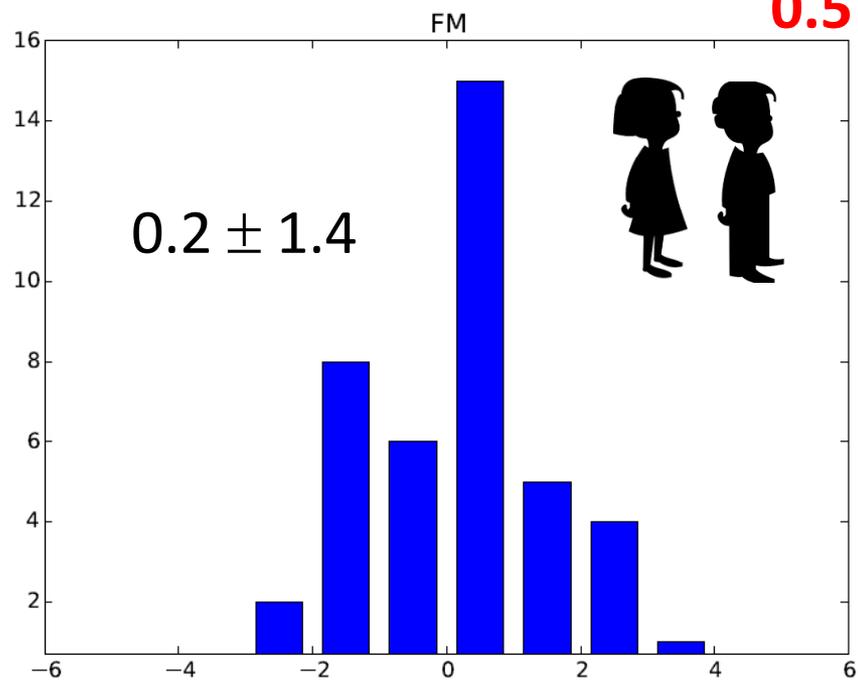
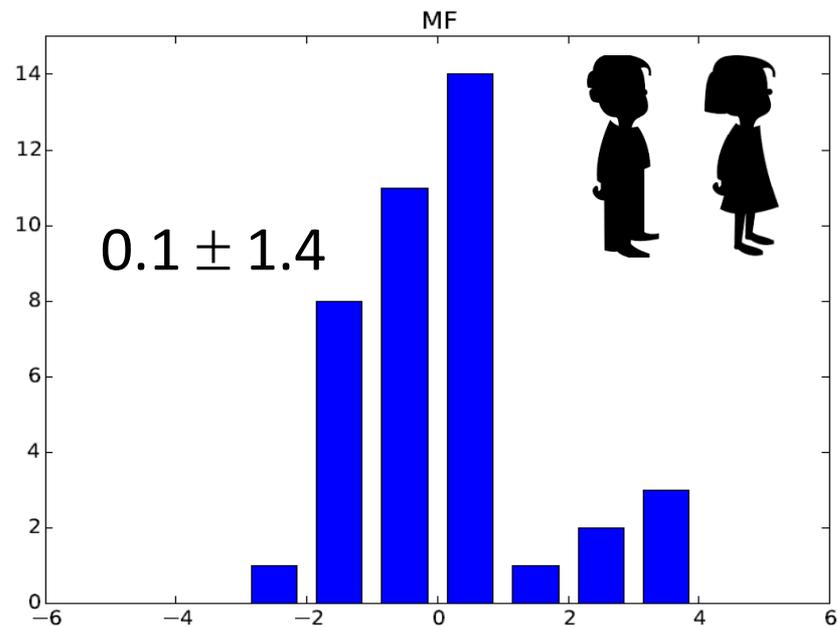
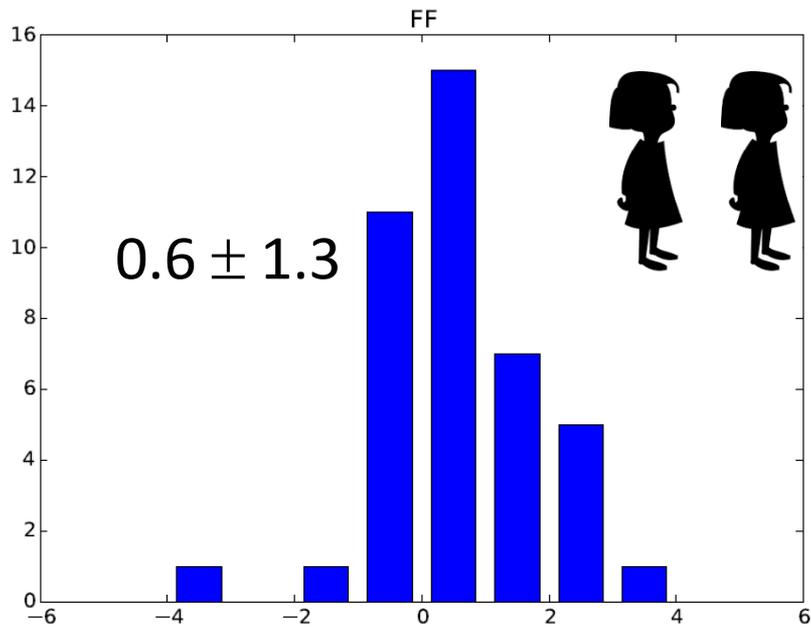
- Sing Sing prison,
- a reformatory for delinquent girls,
- public and private Brooklyn schools.



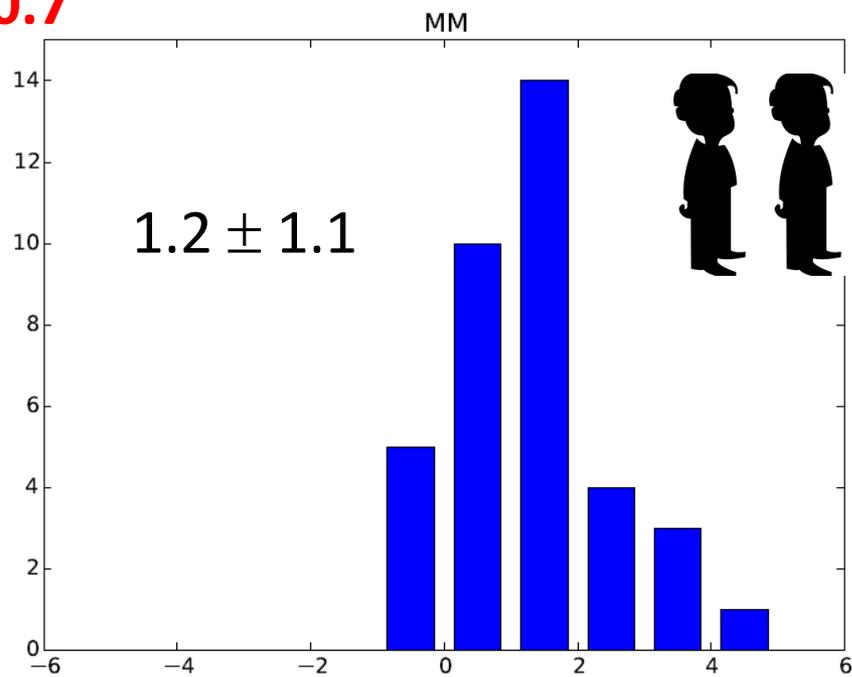
...within a given more or less homogeneous group members of an alien group may be introduced (...)
The group can assimilate, as it were, a certain number, but beyond that point assimilation is rendered difficult or impossible and the group tends to break up along the lines of cleavage created by the alien group forming a minority group within the majority group.

[J. L. Moreno, Who shall survive? A new approach to the problem of human interrelations, Washington D.C., 1934]

<https://archive.org/stream/whoshallsurviven00jlmo#page/2/mode/2up>



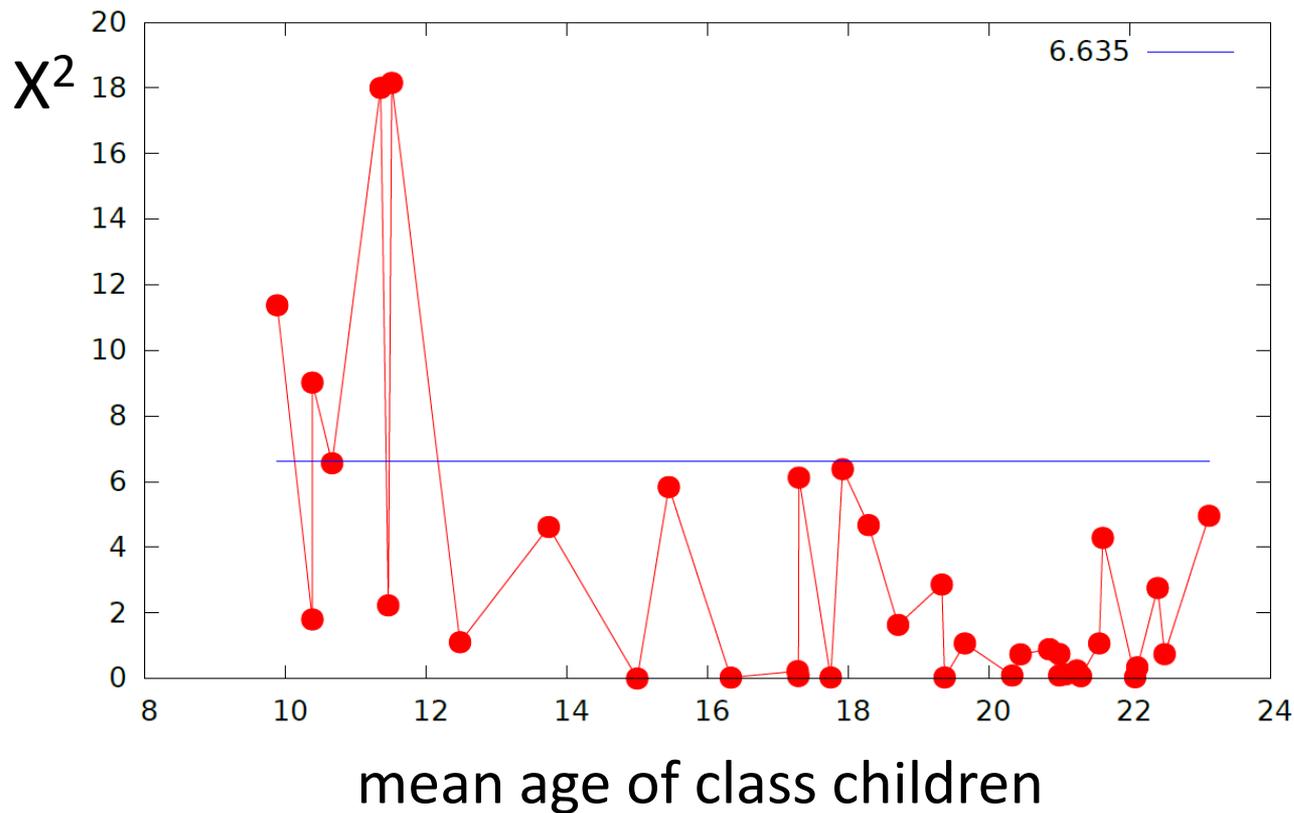
0.5 ± 0.7



A test of statistical significance

$$X^2 = \frac{(k + m)(k_1 m_2 - k_2 m_1)^2}{km(k_1 + m_1)(k_2 + m_2)} > 6,635 \quad ? \quad \text{for statistical significance } 0,99$$

(one degree of freedom)

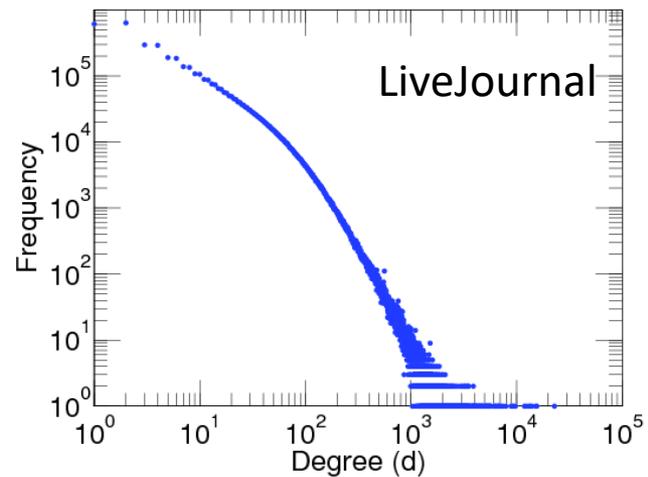


[N. Mantel, *J. of the Amer. Statistical Assoc.* 58, 690 (1963);

S. Brandt, *Statistical and Computational Methods in Data Analysis*, Springer, 1997, Table I.7]

Social networks are supposed to be:

- heterogeneous
- clustered
- assortative



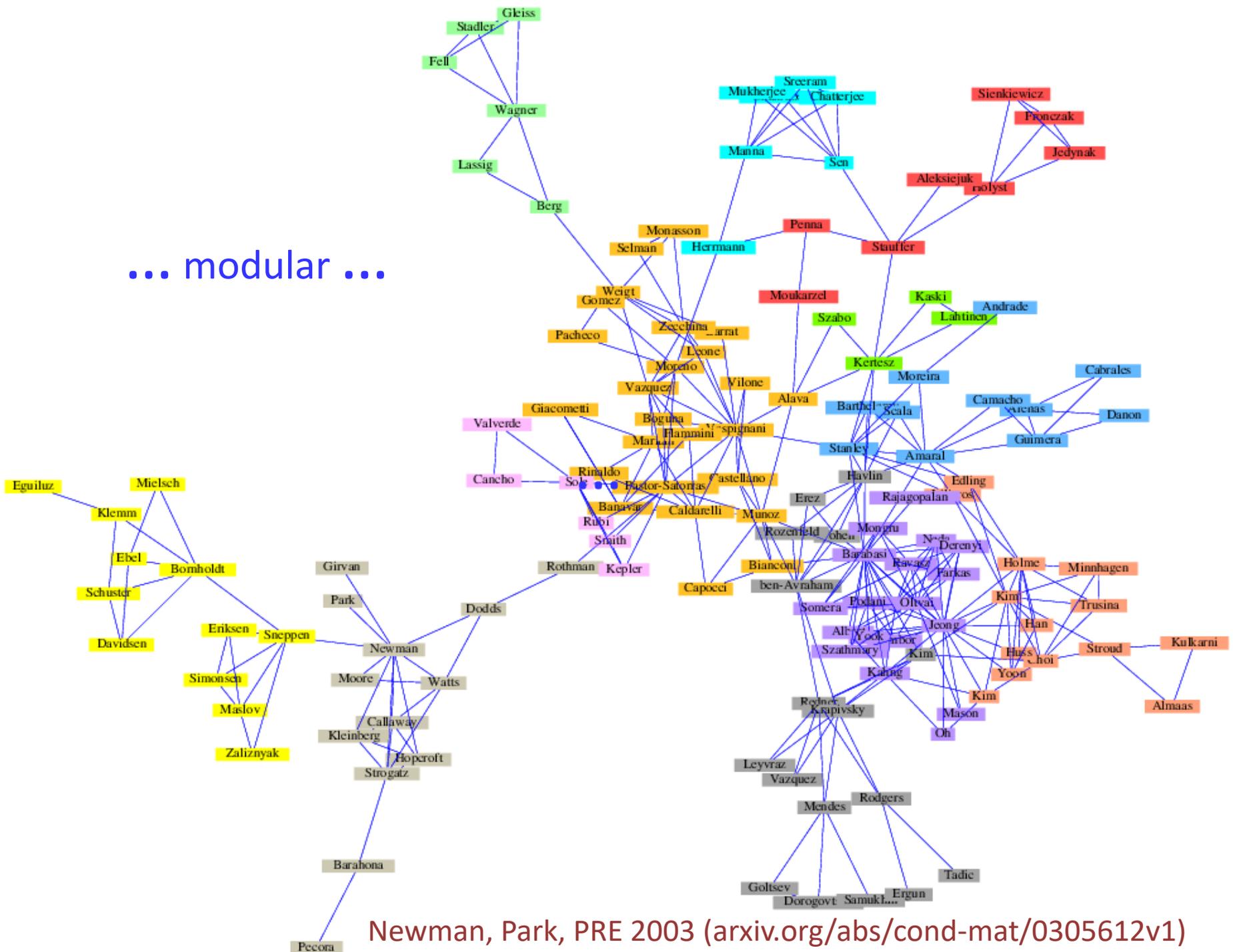
...

	network	n	r
real-world networks	physics coauthorship ^a	52 909	0.363
	biology coauthorship ^a	1 520 251	0.127
	mathematics coauthorship ^b	253 339	0.120
	film actor collaborations ^c	449 913	0.208
	company directors ^d	7 673	0.276
	Internet ^e	10 697	-0.189
	World-Wide Web ^f	269 504	-0.065
	protein interactions ^g	2 115	-0.156
	neural network ^h	307	-0.163
	food web ⁱ	92	-0.276

Network	C
Web [2]	0.081
Flickr	0.313
LiveJournal	0.330
Orkut	0.171
YouTube	0.136

Newman, PRL 2002 (arxiv.org/pdf/cond-mat/0205405.pdf)

... modular ...



Newman, Park, PRE 2003 (arxiv.org/abs/cond-mat/0305612v1)

homophily : similarity breeds connection

social contagion : connection breeds similarity

Do people befriend others who are similar to them, or do they become more similar to their friends over time?

movies, music → homophily

Exceptions: classical/jazz → contagion

indie/alternative → anti-contagion

[Lewis et al., PNAS 109 (2012)]

		women			
		black	hispanic	white	other
men	black	506	32	69	26
	hispanic	23	308	114	38
	white	26	46	599	68
	other	10	14	47	32

Newman, SIAM Rev 2003 (arXiv:cond-mat/0303516)

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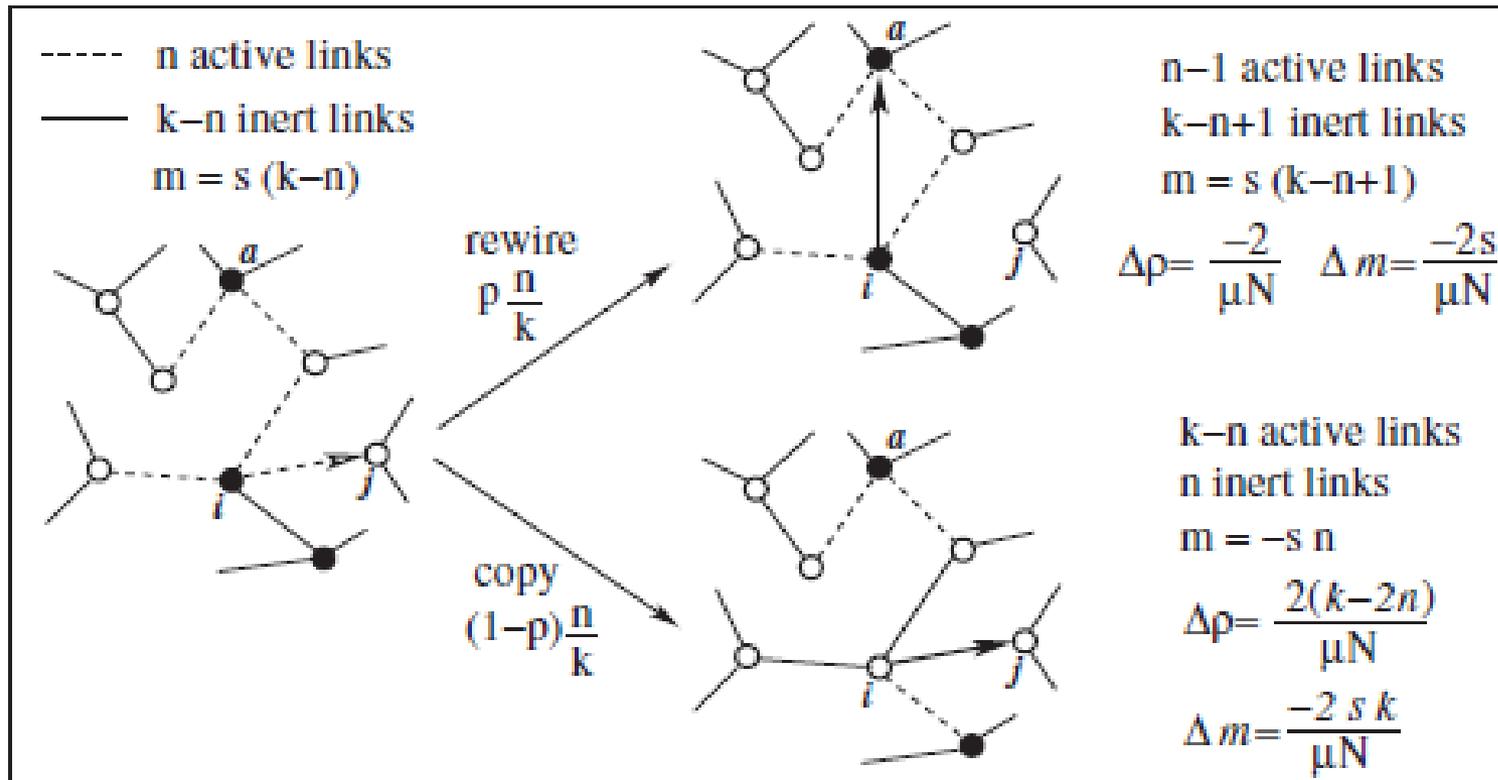
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Coevolving voter model

The model system is a network of nodes decorated with spins. Two processes compete here:

rewiring (->homophily) and flips (->contagion).



Equations of motion after Vazquez et al.

density of active links

prob of n active out of k links

flip

rewire

number of all links

$$\frac{d\rho}{dt} = N(1-p) \sum_k P(k) \sum_{n=0}^k B(n/k) \frac{n}{k} \frac{k-2n}{N\mu/2} + Np \sum_k P(k) \sum_{n=0}^k B(n/k) \frac{n}{k} \left(\frac{-1}{N\mu/2} \right)$$

[F. Vazquez, V. M. Eguiluz, M. San Miguel, PRL 100 (2008) 108702]

Equations of motion after Vazquez et al.

density of active links

flip

active links \leftrightarrow frozen links

$$\frac{d\rho}{dt} = N(1-p) \sum_k P(k) \sum_{n=0}^k B(n/k) \frac{n}{k} \frac{k-2n}{N\mu/2}$$

rewire

$$+ Np \sum_k P(k) \sum_{n=0}^k B(n/k) \frac{n}{k} \left(\frac{-1}{N\mu/2} \right)$$

active link \rightarrow frozen link

fraction of active links

[F. Vazquez, V. M. Eguiluz, M. San Miguel, PRL 100 (2008) 108702]

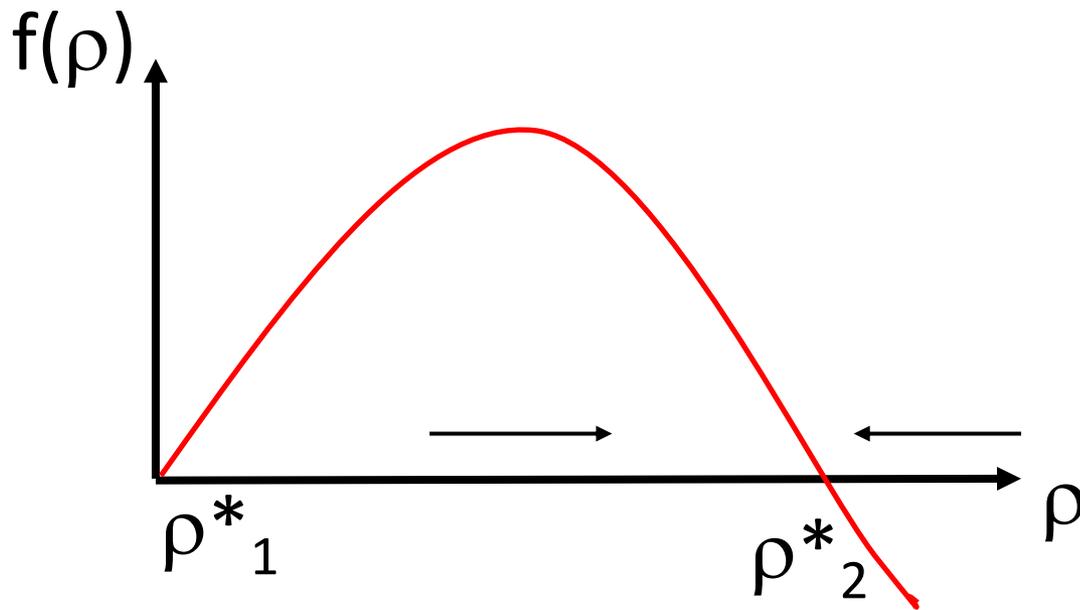
Equations of motion after Vazquez et al.

For the binomial distribution $\sum_{n=0}^k nB(n/k) = k\rho$
and $\sum_{n=0}^k n^2 B(n/k) = k^2 \rho^2 + k\rho(1-\rho)$

then $\frac{d\rho}{dt} = \frac{2\rho}{\mu} [(1-p)(\mu-1)(1-2\rho) - 1] \equiv f(\rho)$

Fixed points: $f(\rho^*) = 0$, then $\rho^*_1 = 0$ (frozen phase)
or

$$\rho^*_2 = \frac{(1-p)(\mu-1) - 1}{2(1-p)(\mu-1)} \quad (\text{active phase})$$



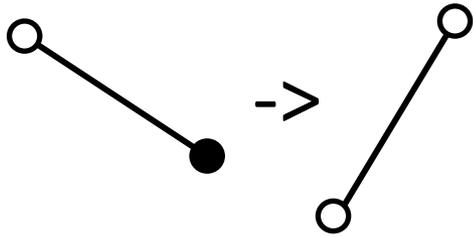
ρ^*_1 is unstable, ρ^*_2 exists and is stable, iff $\left. \frac{df(\rho)}{d\rho} \right|_{\rho=0} > 0$

$$\left. \frac{df(\rho)}{d\rho} \right|_{\rho=0} = \frac{2}{\mu} [(1-p)(\mu-1) - 1]$$

Hence, $\left. \frac{df(\rho)}{d\rho} \right|_{\rho=0} > 0$ for $p < p_c = \frac{\mu-2}{\mu-1}$

p is the probability of rewiring. If p is large enough, active links disappear.

M_{ab} - number of links from a to b

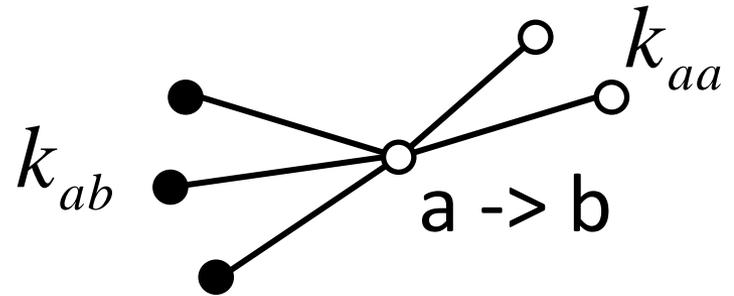


rewiring, probability p

$$M_{ab} \rightarrow M_{ab} - 1$$

$$M_{ba} \rightarrow M_{ba} - 1$$

$$M_{aa} \rightarrow M_{aa} + 2$$



flip, probability $1-p$

$$N_a \rightarrow N_a - 1$$

$$N_b \rightarrow N_b + 1$$

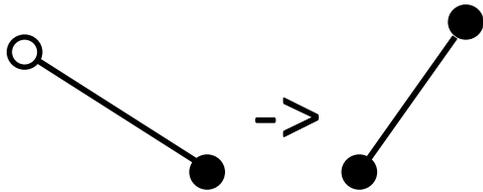
$$M_{aa} \rightarrow M_{aa} - 2k_{aa}$$

$$M_{ab} \rightarrow M_{ab} - k_{ab} + k_{aa}$$

$$M_{ba} \rightarrow M_{ba} - k_{ab} + k_{aa}$$

$$M_{bb} \rightarrow M_{bb} + 2k_{ab}$$

M_{ba} - number of links from b to a

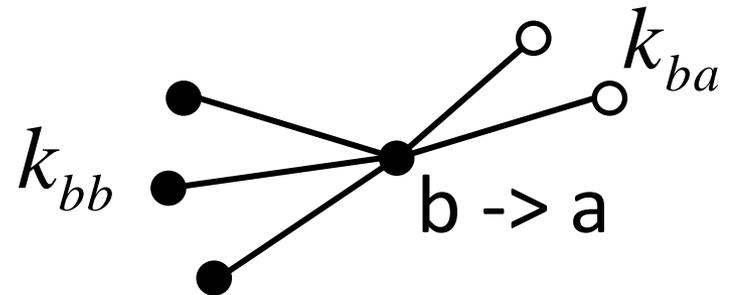


rewiring, probability p

$$M_{ab} \rightarrow M_{ab} - 1$$

$$M_{ba} \rightarrow M_{ba} - 1$$

$$M_{bb} \rightarrow M_{bb} + 2$$



flip, probability $1-p$

$$N_a \rightarrow N_a + 1$$

$$N_b \rightarrow N_b - 1$$

$$M_{aa} \rightarrow M_{aa} + 2k_{ba}$$

$$M_{ab} \rightarrow M_{ab} + k_{bb} - k_{ba}$$

$$M_{ba} \rightarrow M_{ba} - k_{ba} + k_{bb}$$

$$M_{bb} \rightarrow M_{bb} - 2k_{bb}$$

Parameterization: $m, \rho, \beta, \mu_{\pm}$

$$N_+ + N_- = N$$

$$N_+ - N_- = Nm$$

$$M_{+-} = M_{-+} = \frac{N\mu}{2}\rho \quad \text{hence}$$

$$M_{+-} + M_{-+} + M_{++} + M_{--} = N\mu$$

$$M_{++} - M_{--} = N\mu\beta$$

$$N_{\pm} = \frac{N}{2}(1 \pm m)$$

$$M_{++} = \frac{N\mu}{2}(1 - \rho + \beta)$$

$$M_{--} = \frac{N\mu}{2}(1 - \rho - \beta)$$

μ_{\pm} - mean degree of node \pm

$$N_+ \mu_+ = M_{++} + M_{+-}$$

$$N_- \mu_- = M_{--} + M_{-+}$$

hence
$$\mu_{\pm} = \mu \frac{1 \pm \beta}{1 \pm m}$$

Equations of motion

$$\frac{d\rho}{dt} = -p \frac{2\rho(1-\beta m)}{\mu(1-\beta^2)} + (1-p) \frac{2\rho(1-\beta^2-2\rho)}{(1-\beta^2)} +$$
$$-(1-p) \frac{4\rho}{\mu(1-\beta^2)} \left[(1-\beta m) - \rho \frac{1+\beta^2-2\beta m}{1-\beta^2} \right]$$

$$\frac{dm}{dt} = (1-p) \frac{2\rho(\beta-m)}{1-\beta^2}$$

$$\frac{d\beta}{dt} = p \frac{2\rho(m-\beta)}{\mu(1-\beta^2)}$$

What could seem a bit strange:

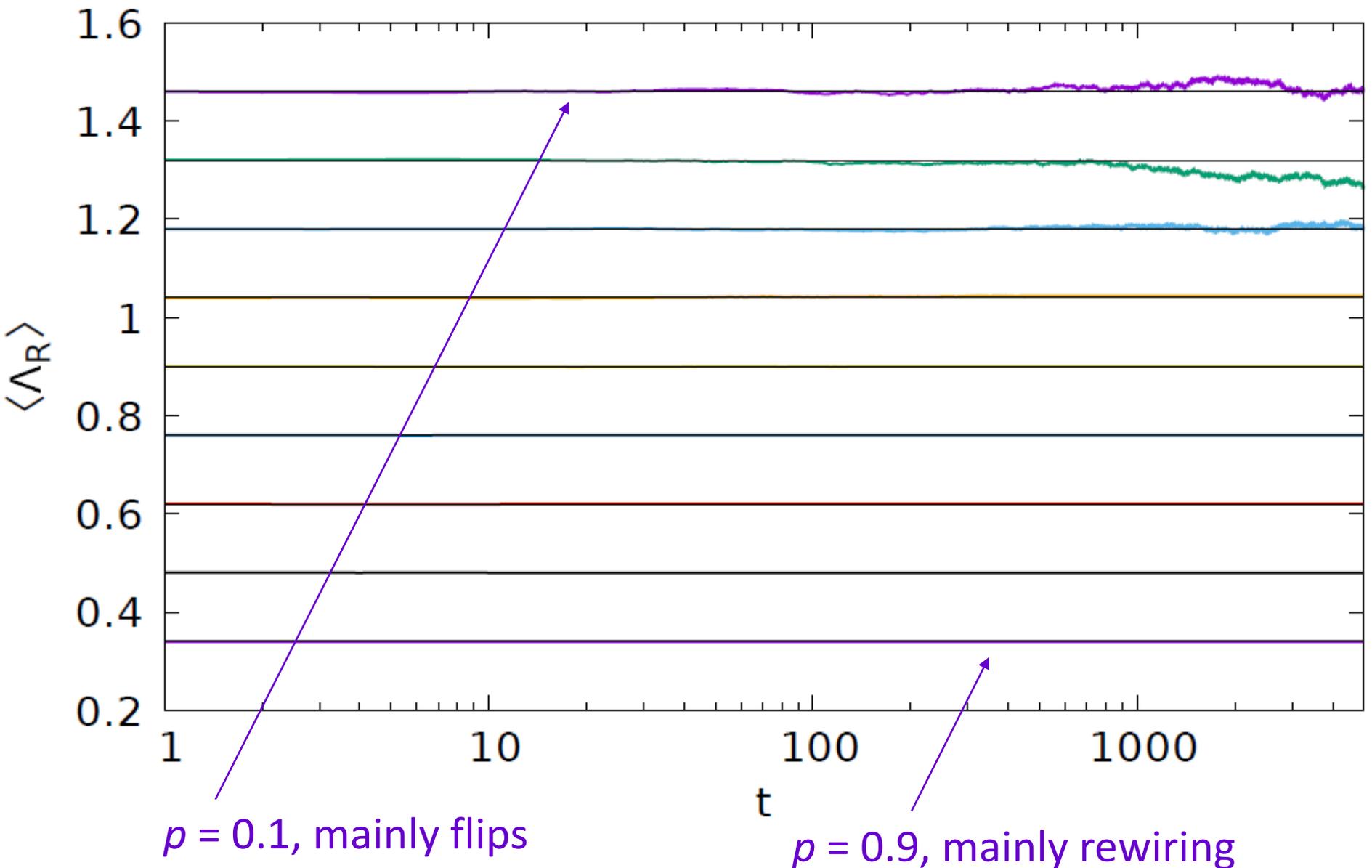
$$\Lambda_R \equiv (1 - p)\mu\beta(t) + pm(t) = \text{const}$$

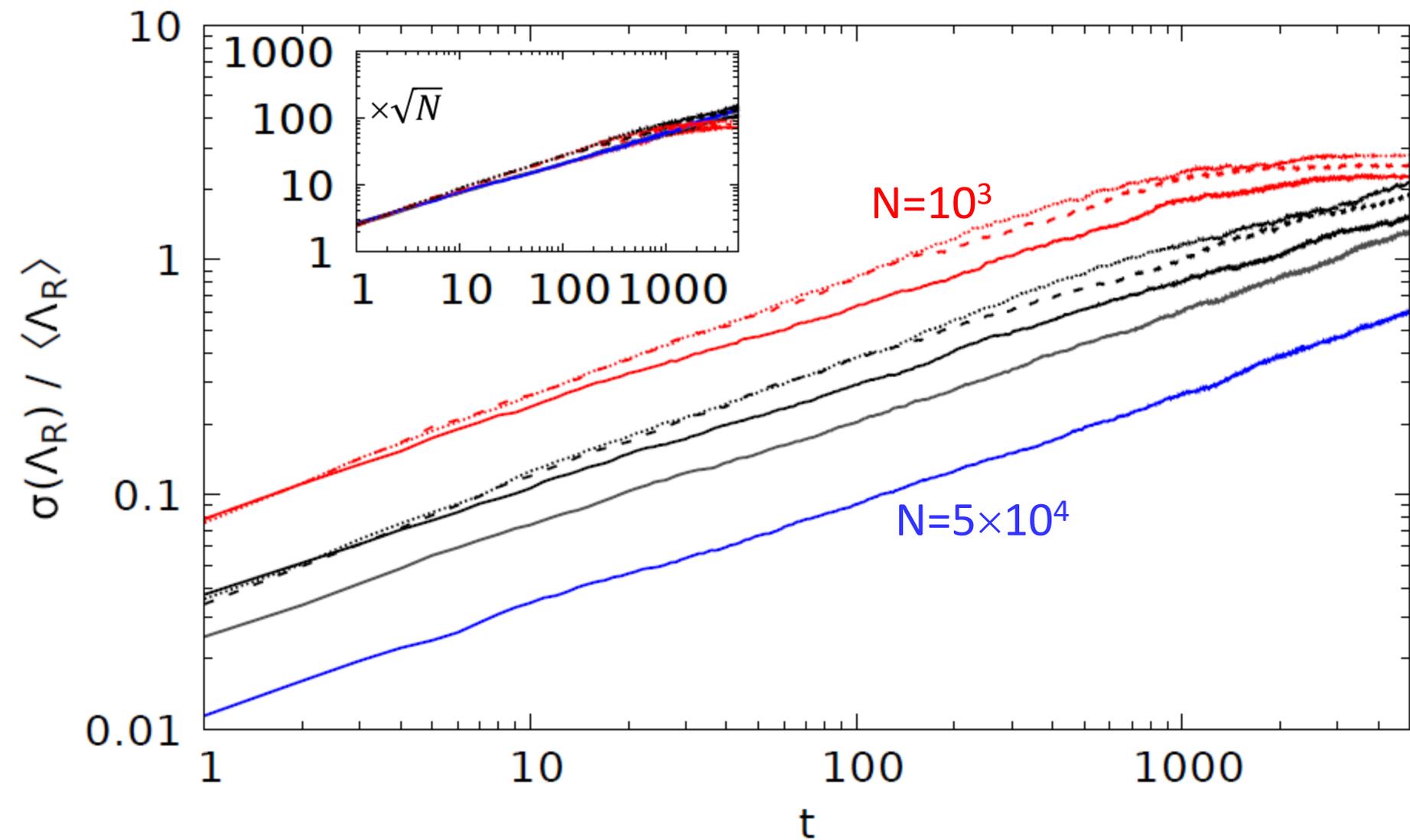
$p = 1$ only rewiring, $m = \text{const}$

$p = 0$ only flips, $\beta = \text{const}$

The final solution depends on the initial state.

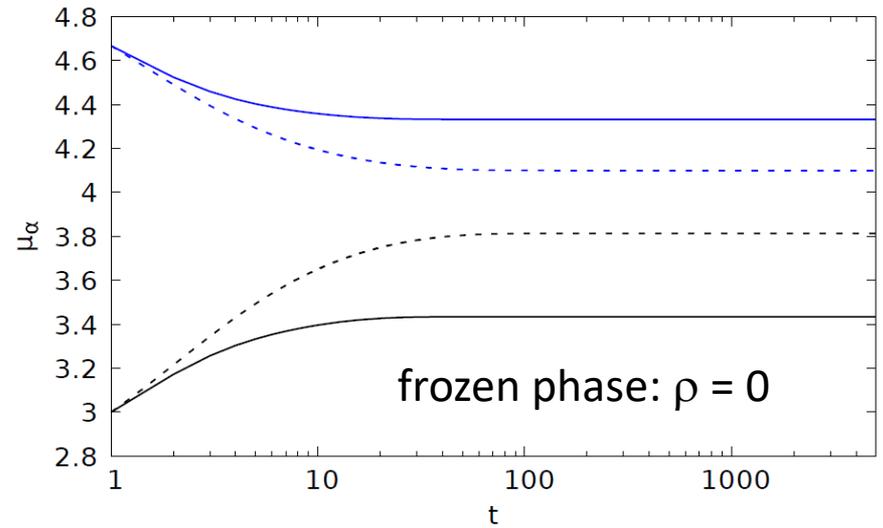
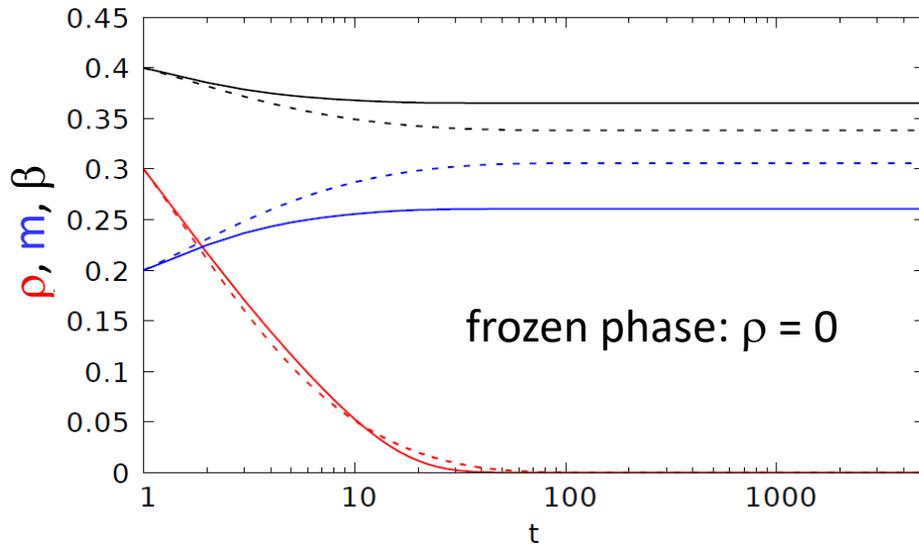
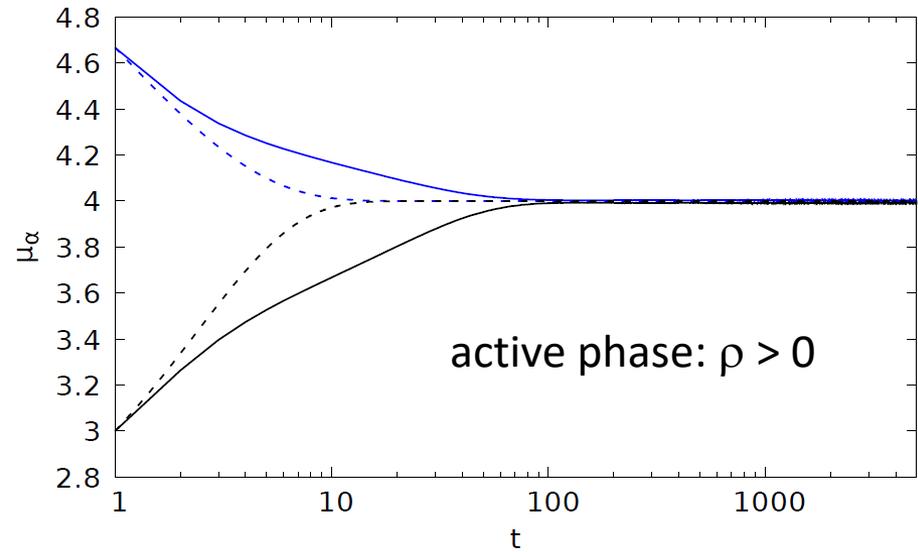
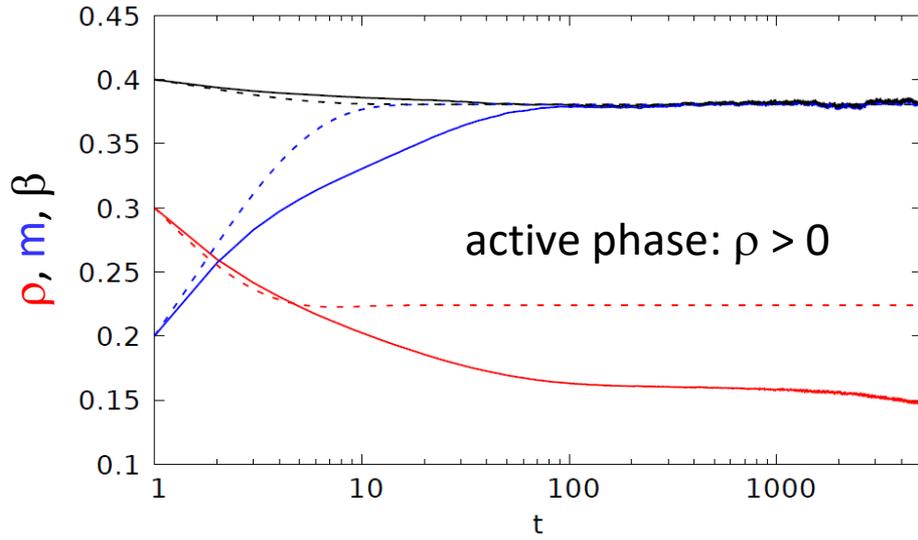
Numerical results: $N=5 \times 10^4$, $\# = 10^3$





solid lines: $\mu = 4$; dashed : $\mu = 20$; dotted: $\mu = 40$

Analytical (---) vs numerical (—) results



Summary

The simulations confirm the mean-field result $\Lambda_R = \text{const.}$

The model has been generalized for the case when the mean number of neighbors of a node depends on its spin.

Technical details in Toruniewska et al., PRE 96 (2017) 042306.

In terms of social networks, **the numbers of acquaintances** can be different for members of different groups.

In the active phase, this difference disappears.

In the frozen phase the group is split ($\rho = 0$), and the numbers of acquaintances remain different.



Thank you



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