

# Magnetism of clustered random networks

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## ***BASIC ELEMENTS:***

**Erdős-Renyi network with enhanced clusterization**

**$\pm 1$  variables at the nodes with the Ising interaction  $J$  along the links**

*„Non-scientists tend to think that science works by deduction. But actually science works mainly by **metaphor**. And what's happening is that the kind of metaphors people have in mind are changing.”*

[W. Brian Arthur, SFI]

# OVERVIEW

**The structure: clustering, degree distribution**

**$J > 0$ : Curie temperature; MC vs mean field**

**$J < 0$ : Reference system: Archimedean lattice**

**$J < 0$ : spin glass, role of clustering**

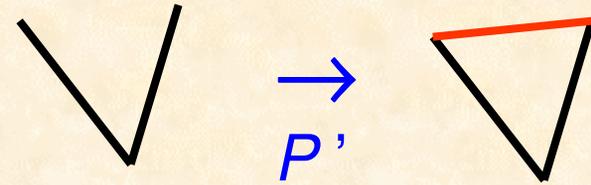
Recent review :

SN Dorogovtsev, AV Goltsev, JFF Mendes,

*Critical phenomena in complex networks*

arXiv:0705.0010, Pt. VI

# ***THE STRUCTURE***



**The Erdős-Renyi network:**

**Make a link between each two nodes  
with probability  $p_0 = \langle k_0 \rangle / N$**

**The enhanced clusterization\*:**

**Make a link between neighbours of  
each node with probability  $p'$**

\*Method of P Holme, BJ Kim, PRE 65 (2002 ) 026102

The clustering coefficient  $C$  = probability, that two neighbours of a node are linked.

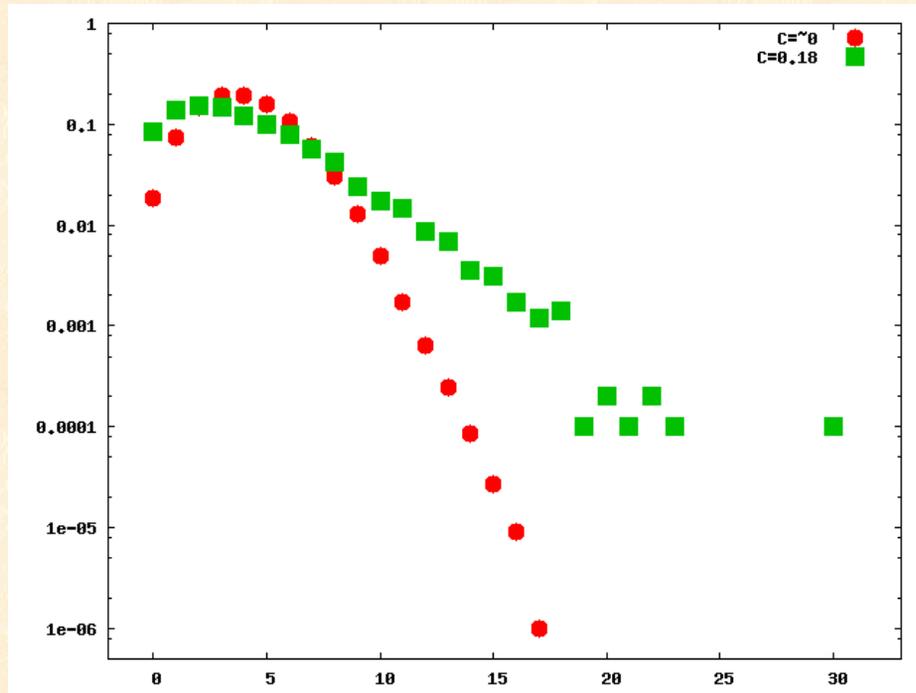
**Result:  $\langle k \rangle = 4.0$ ,  $0 < C < 0.18$ ,**

# DEGREE DISTRIBUTION

$P(k)$

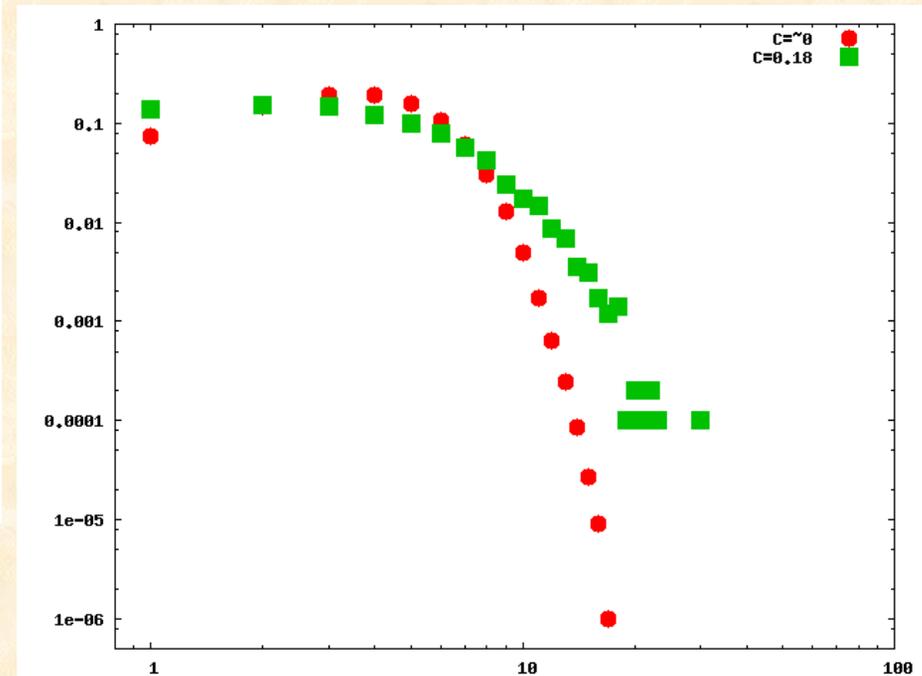
$C \approx 0$ , Poisson

$C = 0.18$



$k$

$P(k)$



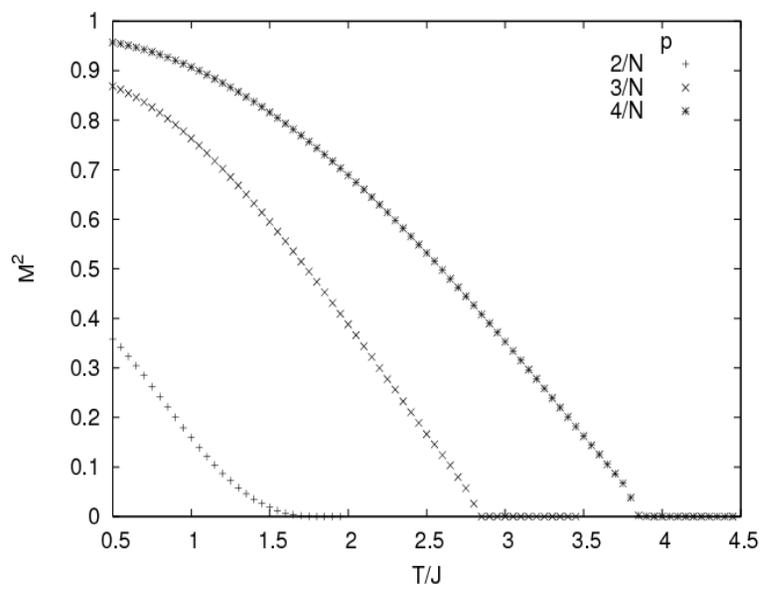
$k$

# $J > 0$ , CURIE TEMPERATURE

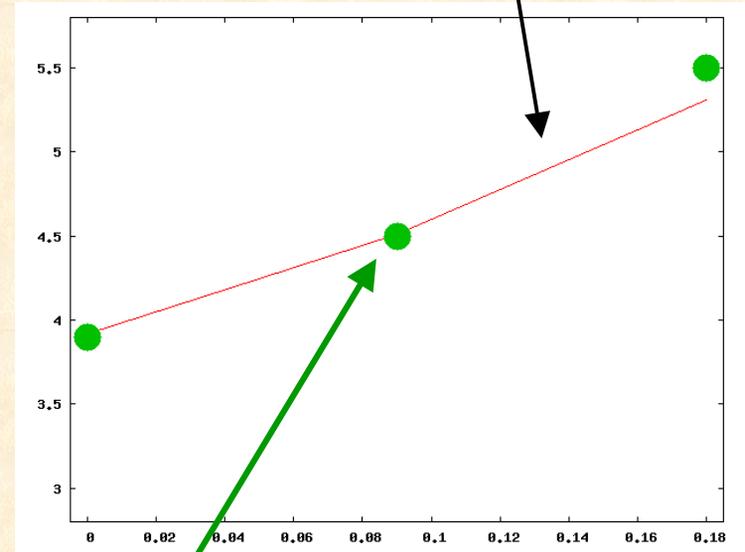
$$\frac{2J}{T_c} = \ln \frac{z_2 + z_1}{z_2 - z_1} \approx \ln \frac{\langle k^2 \rangle}{\langle k^2 - 2k \rangle}$$

$T_c$

squared magnetization,  $C \approx 0$



temperature



Clustering coefficient  $C$

MC heat bath,  $N=10^5$

$J < 0$

## SPIN GLASS TEMPERATURE?

I. Kanter, H. Sompolinsky, PRL 58 (1987) 164

Finite coordination number, mean-field theory,  $T=0$

A phase diagram:  $\rho(J)=\delta(J+1) \Rightarrow$  SG

SN Dorogovtsev, AV Goltsev, JFF Mendes, arXiv:0705.0010

For tree-like networks (weak frustration)  $\rho(J)=\delta(J+1)$

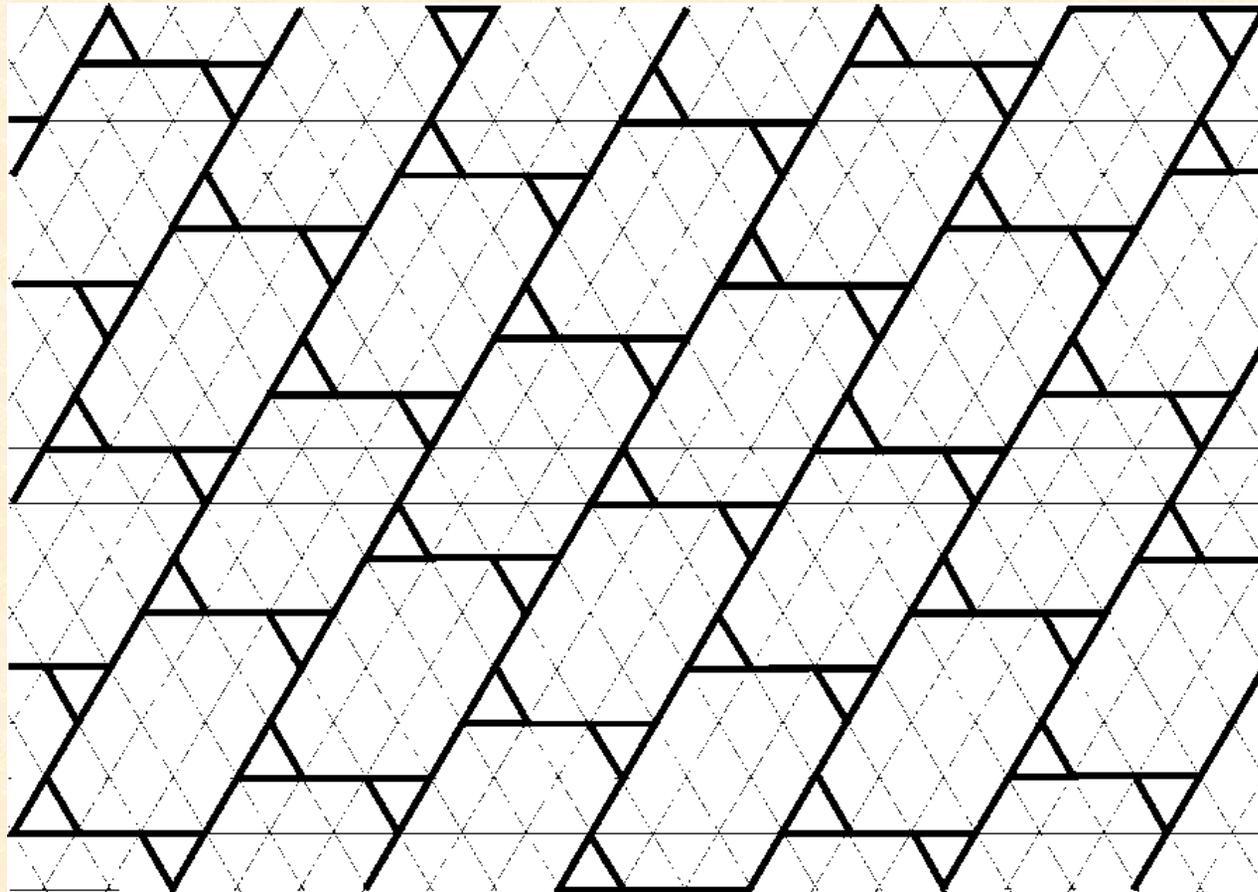
$$cth^2 \beta_{SG} = cth \beta_c = \frac{z_2}{z_1} = \frac{\langle k(k-1) \rangle}{\langle k \rangle}$$

Then, once  $T_c$  increases with  $C$ ,  $T_{SG}$  should increase as well.

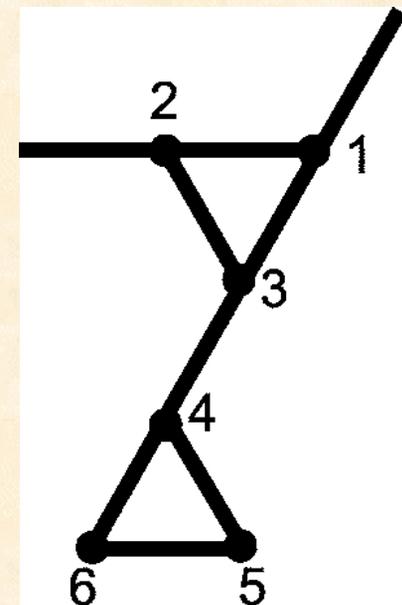
What about the influence of loops ? We have only local loops.

We have a reference system – the Archimedean lattice, where only local loops are present, too.

## Reference system: stretched Archimedean $(3,12^2)$ lattice



- frustrated
- 2D
- energy gap

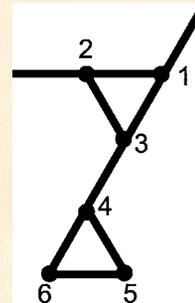


**Unit cell**

MJ Krawczyk et al., PRB 72 (2005) 024445

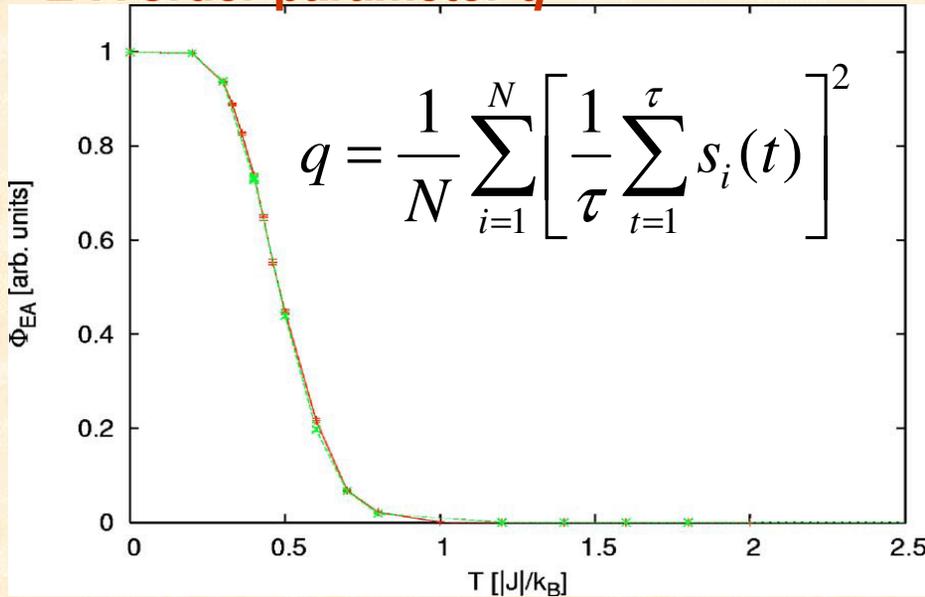
# Archimedean lattice: ground state degeneracy

Ground state	s1	s2	s3	s4	s5	s6
A	-	+	+	-	-	+
B	-	-	+	-	+	+
C	-	+	-	+	-	+
D	+	-	-	+	+	-
E	+	+	-	+	-	-
F	+	-	+	-	+	-



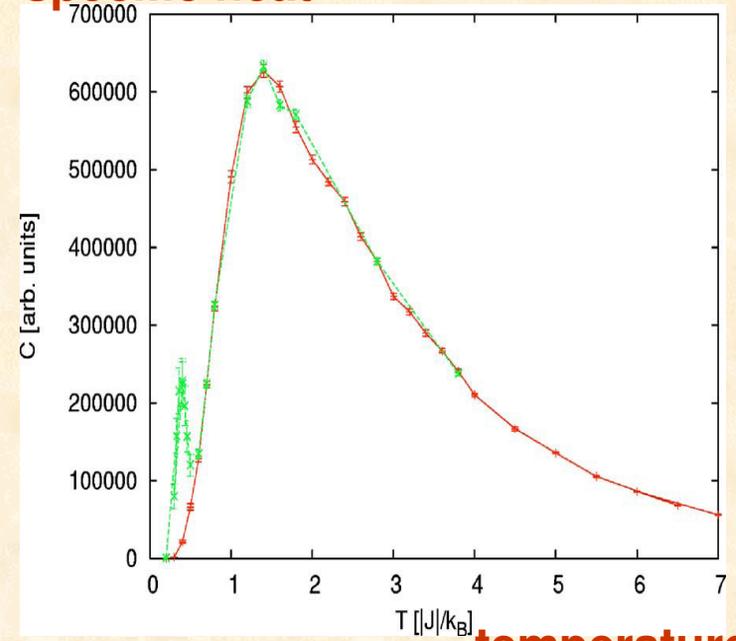
Pairs which can be flipped  
 s3 , s4 to C or s2 , s5 to B  
 s2 , s5 to A or s1 , s6 to F  
 s1 , s6 to E or s3 , s4 to A  
 s3 , s4 to F or s2 , s5 to E  
 s2 , s5 to D or s1 , s6 to C  
 s1 , s6 to B or s3 , s4 to D

E-A order parameter  $q$



temperature

specific heat



temperature

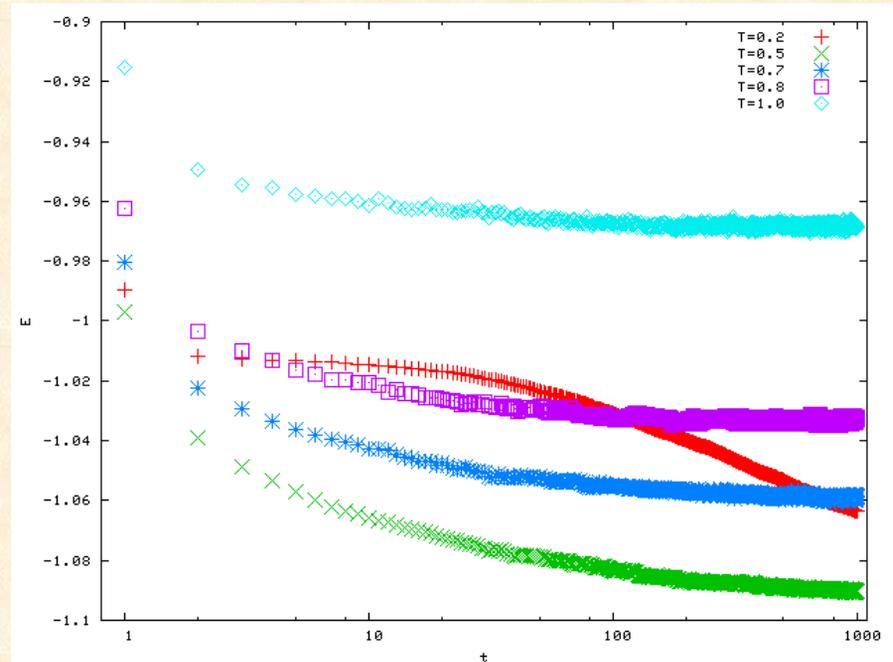
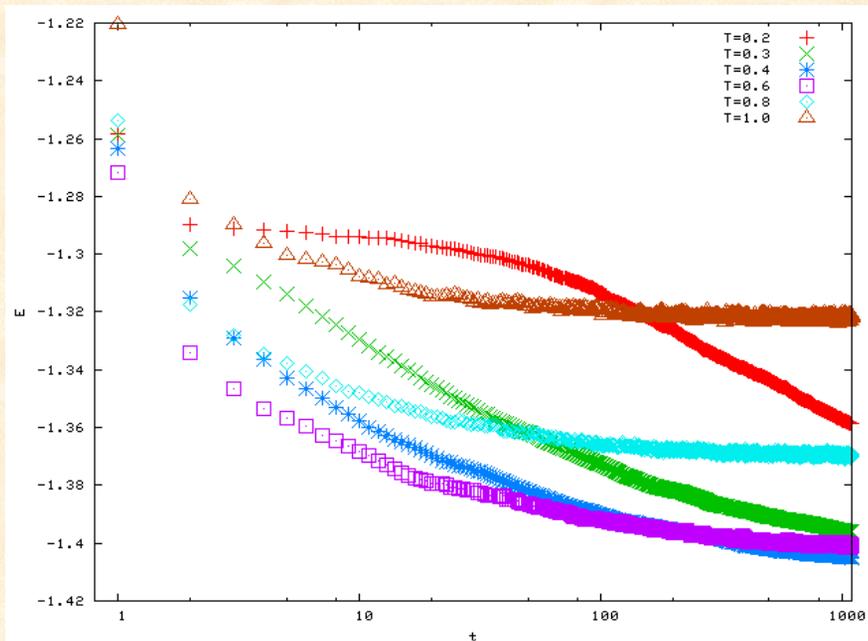
$J < 0$

# ENERGY RELAXATION

*Energy*

$C \approx 0$

$C=0.18$



*time*

*time*

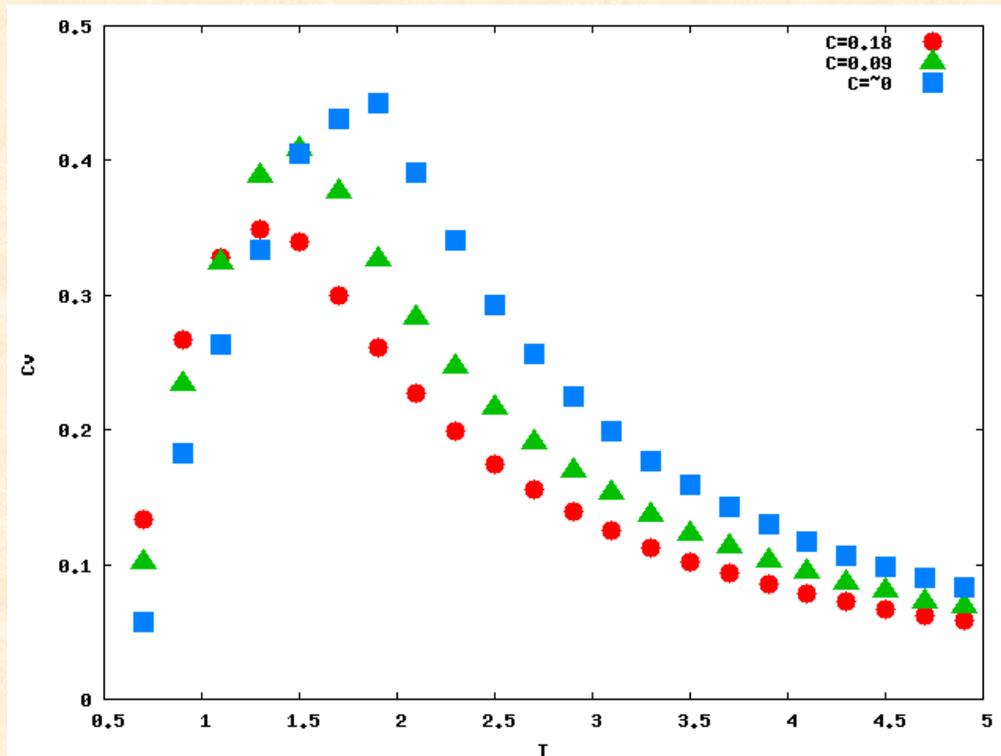
$E \approx \text{const} (M(t=0))$

$E \approx \text{const} (t)$  for  $t > 1000, T > 0.7$

$$J < 0$$

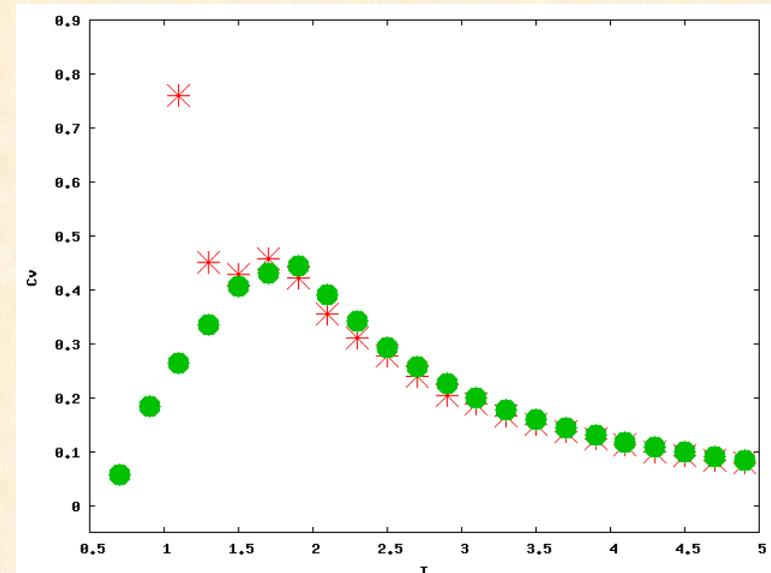
# SPECIFIC HEAT $C_V$

$$C_V = dU/dT$$



temperature

$$C_V = \beta \sigma_E^2, \quad dU/dT$$



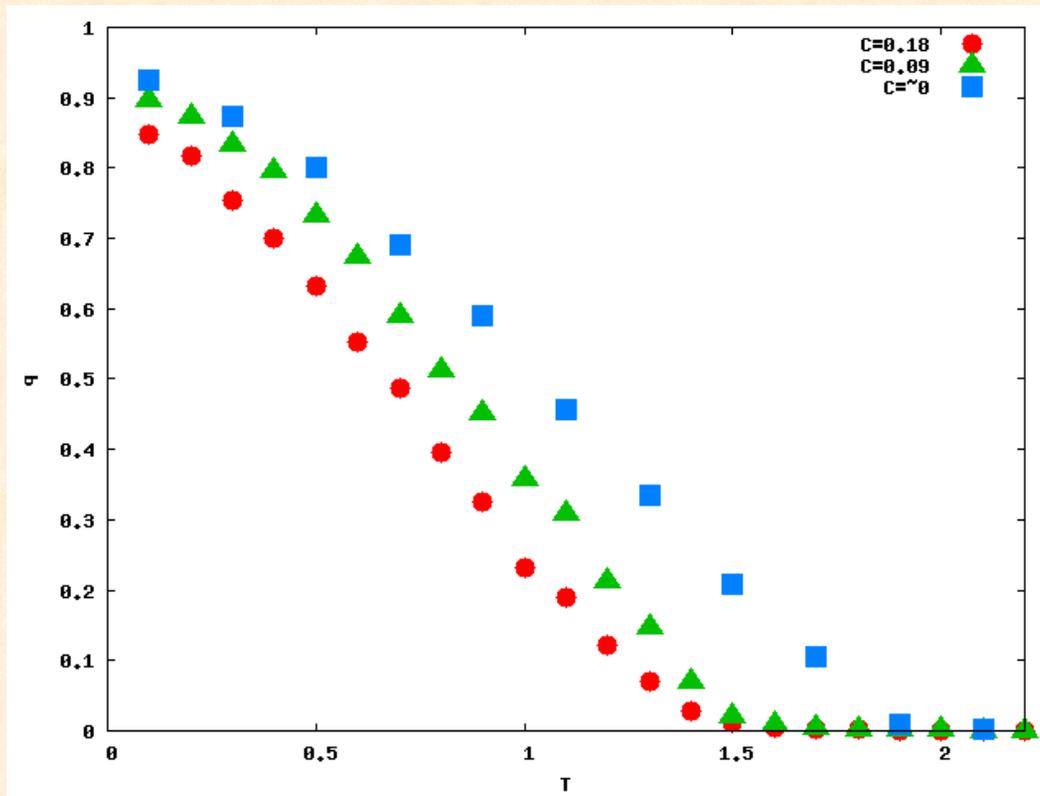
temperature

$J < 0$

# E-A ORDER PARAMETER $q$

$$q = \frac{1}{N} \sum_{i=1}^N \left[ \frac{1}{\tau} \sum_{t=1}^{\tau} s_i(t) \right]^2$$

$q$



temperature

..whereas for the tree-like networks

$C$	$T_{SG}$
0	1.82
0.09	1.97
0.18	2.17

# CONCLUSIONS

- For  $J > 0$ , consequences of the enhancement of  $T_c$  with the clustering coefficient  $C$  reduce to the influence of the modification of  $\langle k^2 \rangle$ .
- For  $J < 0$ , the density of frustrations increases with  $C$ , and the **para-SG** transition temperature decreases.

## Further steps:

- the correlation functions vs  $T, C$
- $\delta(k)=3$  (energy gap)
- ?...

## Links to other areas:

- solid state physics: degeneracy, spin glass > spin liquid?
- computation theory: MAX-CUT, satisfiability, ...
- social networks: clustered, small world, > directed
- game theory: network congestion game
- updating order > temporal networks?