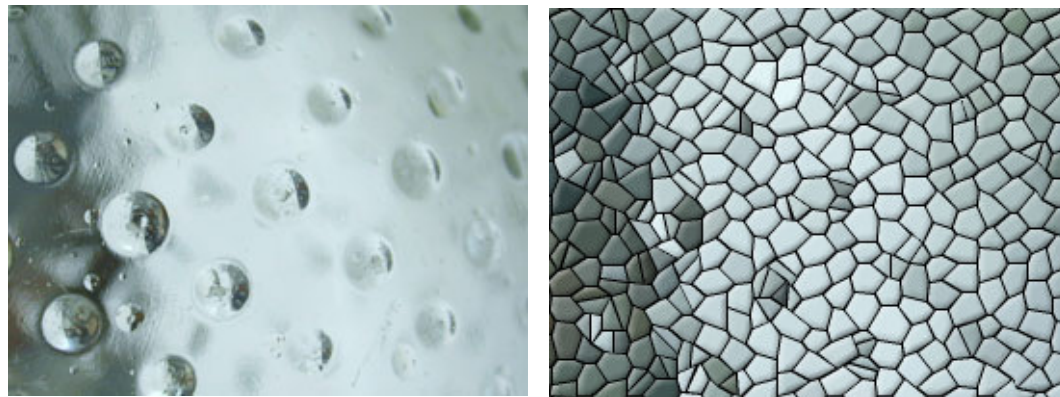


# Free-energy barriers of spin glass (in 3D)



A. Nußbaumer, Elmar Bittner and  
Wolfhard Janke

CompPhys08, Leipzig 29<sup>th</sup> Nov. 2008

## Experimental Part :-)

Question: What is a spin glass (for us)?

Answer:

collection of spins with a low-T state  
that is frozen disordered

per site magnetisation:  $m_i = \langle \sigma_i \rangle \neq 0$  (like ferrromagnet)

no net magnetisation:  $m = \frac{1}{N} \sum_i m_i = 0$  (unlike ferrromagnet)  
exact: of order  $\frac{1}{\sqrt{N}}$

(ferromagnet has completely ordered low-T state, i.e. a net magnetisation)

Q: Looking at a single spin, can I decide if he belongs to a spin glass?

A: NO!

# What exactly do we want to calculate?

From experiment:

**impurities** move **slowly**/not at all  
**spins** change much **faster**

to quench=abschrecken  
(im Sinne eines gekochten Eis)

} quenched couplings



- ① draw some  $J_{ij}$
- ② keep them fixed
- ③ calculate some quantity, e.g

$$F = -T \log Z = -T \log \sum_{\{\sigma\}} e^{-\beta H(\sigma_1, \dots, \sigma_N)}$$

- ④ do average over couplings = [...]

$$[F] = -T [\log Z] = -T \left[ \log \sum_{\{\sigma\}} e^{-\beta H(\sigma_1, \dots, \sigma_N)} \right]$$

Is this averaging allowed?

After all, there is only **one** set of couplings in a real SG:

free energy/degree of freedom:

$$\frac{F(\mathbf{J})}{N} = f(\mathbf{J})$$

at thermodynamic limit ( $N \rightarrow \infty$ ):

$$f(\mathbf{J}) = [f]$$



self-averaging of the free energy (density)

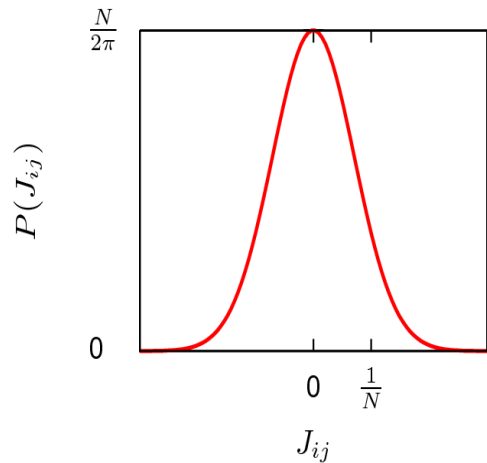
# We are looking at two models:

## a) Sherrington-Kirkpatrick (SK) model

[D. Sherrington and S. Kirkpatrick, PRL 35 (1975) 1792]

$$H_{\text{SK}} = - \sum_{i < j} J_{ij} S_i S_j$$

Gaussian distribution with:



$$\langle J_{ij} \rangle = 0$$

$$\langle J_{ij} \rangle^2 - \langle J_{ij}^2 \rangle = \frac{1}{N}$$

Note:

both types of couplings are believed to show the same physics at finite temperatures!  
this is just our choice

mean field

$$T_c = 1$$

Parisi's replica solution [PRL 43 (1979) 1754]

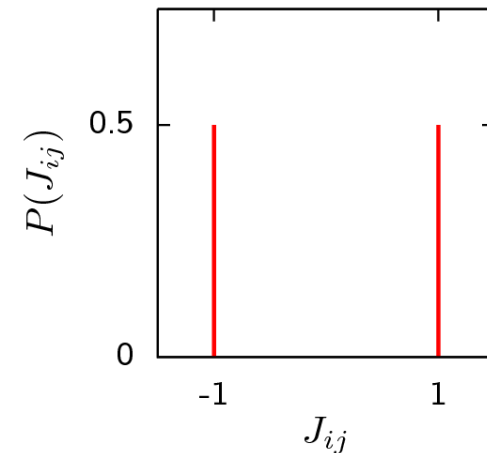
or mathematical: M. Talagrand, C. R. Acad. Sci. Paris, Ser. I 337 (2003) 111

## b) Edwards-Anderson (EA) model

[S. F. Edwards and P. W. Anderson, J. Phys. F: Metal Phys. 5 (1975) 965]

$$H_{\text{EA}} = - \sum_{\langle ij \rangle} J_{ij} S_i S_j$$

Bimodal distribution:



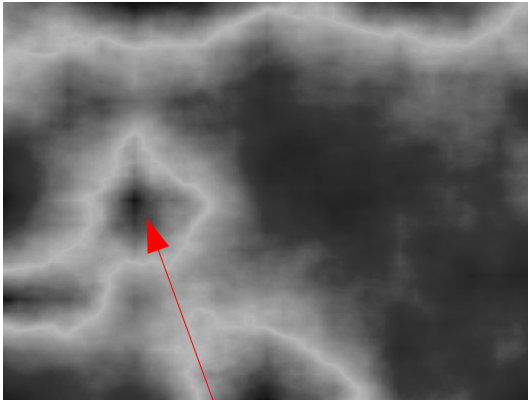
3 dimensions

$T_c \approx 1.10$  from MC [M. Hasenbusch, A. Pelissetto and E. Vicari, J. Stat. Mech. (2008) L02001]

no solution, problem is NP hard

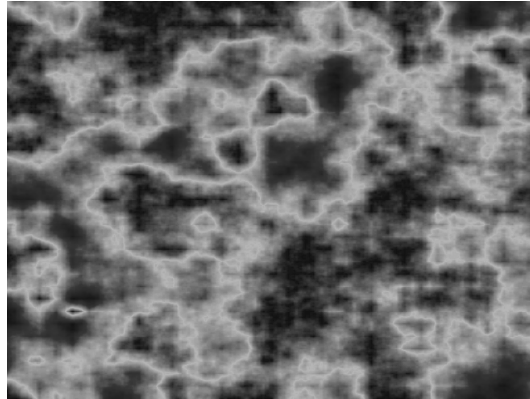
# Multi-Valley picture

microscopically

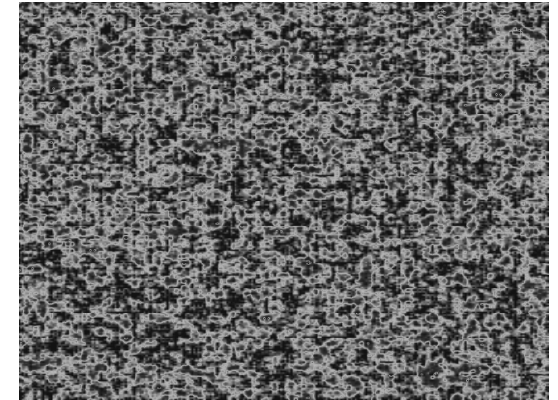


“valley”

intermediate



macroscopically



Now, quantities in terms of valleys:

e.g. site-magnetisation:  $m_i^a = \langle \sigma_i \rangle_a$

average over  
all valleys

$P_a = e^{-\beta F_a}$  statistical weight of valley  $a$

$$m_i = \sum_a P_a \cdot m_i^a$$

define **OVERLAP**  
of valley  $a$  and  $b$ :

$$q_{ab} = \frac{1}{N} \sum_i m_i^a m_i^b$$

$a$  and  $b$  are in the  
same valley:

$$a=b \rightarrow q_{aa} = q_{EA}$$

completely different  
valleys:

$$a \neq b \rightarrow q_{ab} = ?$$

define OVERLAP distribution:  $P_j(q) = \sum_{ab} P_a \cdot P_b \cdot \delta(q - q_{ab})$  and  $P(q) = [P_j(q)]$

↑  
probability that valleys a and b (=pure states a and b)  
have mutual overlap  $q$

the OVERLAP is the physical order parameter

# So, and what happens in less than $\infty$ dimensions?

Bray/Moore & Fisher/Huse  
droplet picture/scaling theory

Parisi  
Replica Symmetry Breaking

$$E \sim L^\theta, \theta > 0$$

  $E \rightarrow \infty$

system-size excitations  
for  $L \rightarrow \infty$

$$E \sim L^\theta, \theta = 0$$

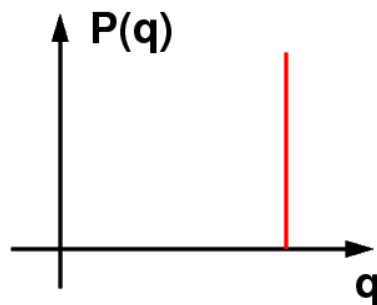
  $E \rightarrow E_0$

fractal  
 $d_s < d$

dimension of excitations

space filling  
 $d_s = d$

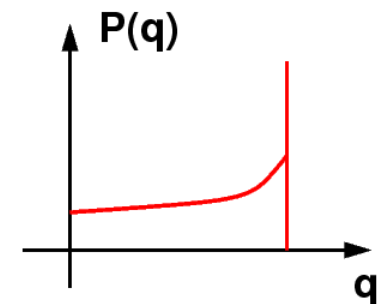
trivial



$$P(0) \sim L^{-\theta}$$

**GS structure**

non-trivial



$$P(0) \sim L^0$$

...

# What can be done to verify 3D behavior:

## Measure with the computer ...

stiffness exponents

e.g. apply two different boundary conditions

susceptibilities,

correlation functions:  $[\langle s_i s_j \rangle^2] - [\langle s_i \rangle^2][\langle s_j \rangle^2] \sim T/YR^0$   $R$ : distance between  $i$  and  $j$ ,  
average in a single pure state

**distribution of overlap parameter  $P(q)$**

and check what happens at  $q=0$

## Use “advanced” algorithms such as ...

parallel tempering

multi-overlap

Wang-Landau in  $E$  and  $q$

n-fold-way

waiting-time method

...

or combinations of the above as

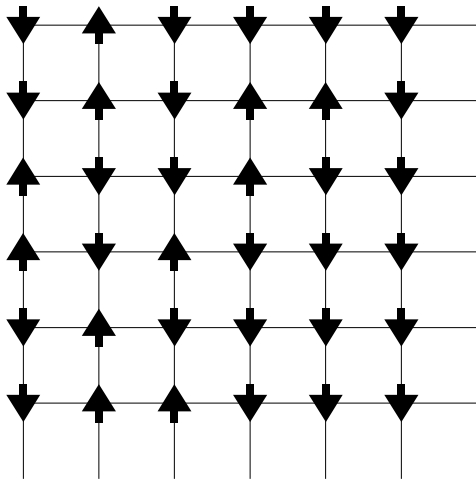
n-fold-way+multi-overlap+parallel tempering



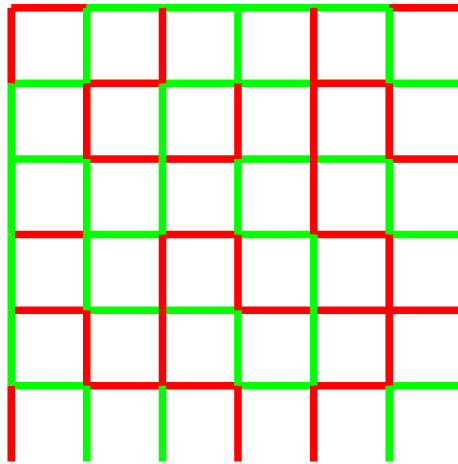
# How to practically measure the overlap for the 3D EAI?

## Recipe:

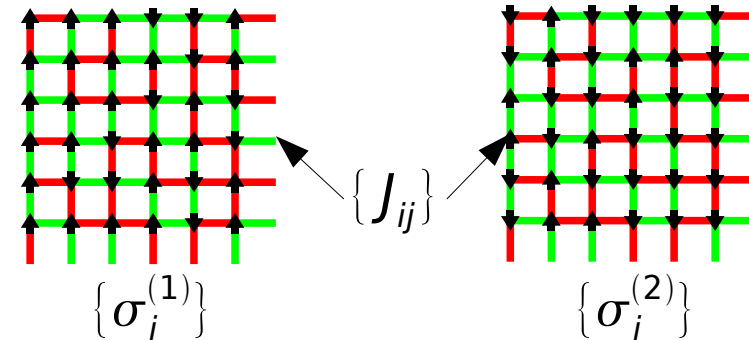
- ① take normal Ising model with spins  $\{\sigma_i^{(1)}\}$



- ② draw random couplings  $\{J_{ij}\}$  for every pair of spins



- ③ introduce second “independent” system  $\{\sigma_i^{(2)}\}$  with the same set of couplings  $\{J_{ij}\}$



- ④ choose “advanced” algorithm and do thermalisation

- ⑤ simulate one sweep of system 1

- ⑥ simulate one sweep of system 2

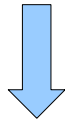
- ⑦ measure overlap

$$q = \frac{1}{N} \sum_i^N \sigma_i^{(1)} \sigma_i^{(2)}$$

repeat the measurement/simulation quite often!

Note,

we measure:  $q = \frac{1}{N} \sum_i^N \sigma_i^{(1)} \sigma_i^{(2)}$



$$q(t) = \frac{1}{N} \sum_i^N \sigma_i^{(1)}(t) \sigma_i^{(2)}(t)$$

This is the overlap distribution  
from 4 pages ago!

$$P_J(q) = \frac{1}{T} \sum_{t=1}^T \delta[q - q(t)] = \sum_{ab} P_a \cdot P_b \cdot \delta(q - q_{ab})$$

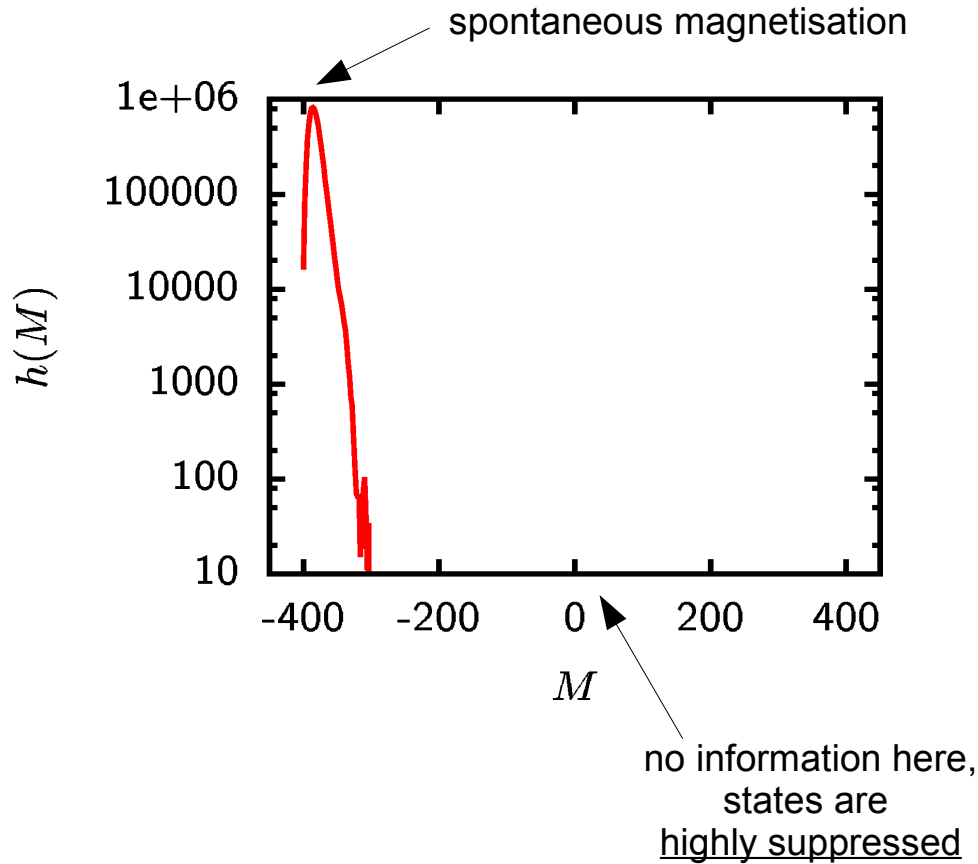
[A. P. Young, PRL 51 (1983) 1206]

for N "very large"

# Multimagnetic algorithm (MuM) 1:

[B.A. Berg and W. Janke, PRL 80 (1998) 4771]

A canonical simulation of the magnetisation



IDEA:  
don't sample Boltzmann but artificial distribution

$$P(m) = \Omega(m) \exp[-\beta H] \quad \longrightarrow \quad \Omega(m) \exp[-\beta H] W(m)$$

about  $W(m)$ :

order parameter:

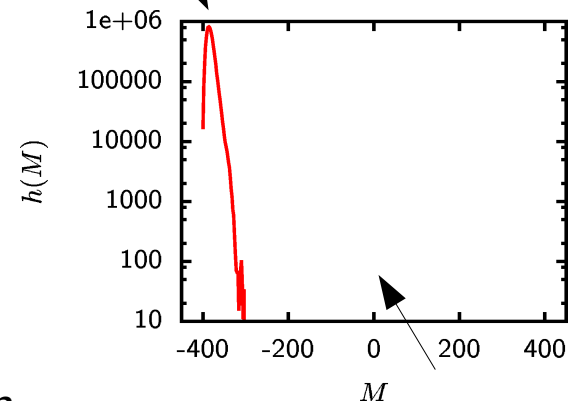
$$q = \sum_{i=1}^V s_i^{(1)} s_i^{(2)}$$

- ① is called “weights”
- ② can have arbitrary values
- ③ canonical expectation values can be recovered:

$$\langle A \rangle^{\text{can}} = \frac{\langle W^{-1} A \rangle}{\langle W^{-1} \rangle}$$

use weights to make distribution “simpler” to sample

sample “less” here

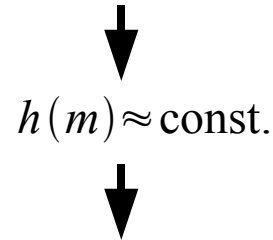


sample “more” here

# Multimagnetic algorithm (MuM) 2:

Which weights are good?

Def.: we want to sample a “flat” histogram



Optimal: inverse weights:  $W(m) = 1/P(m)$

small problem: we don't know this function  
(otherwise the problem already solved)

use iterative approach

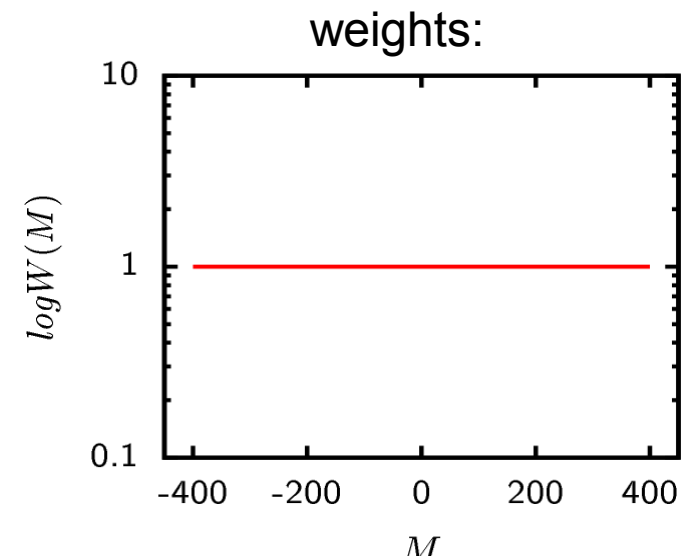
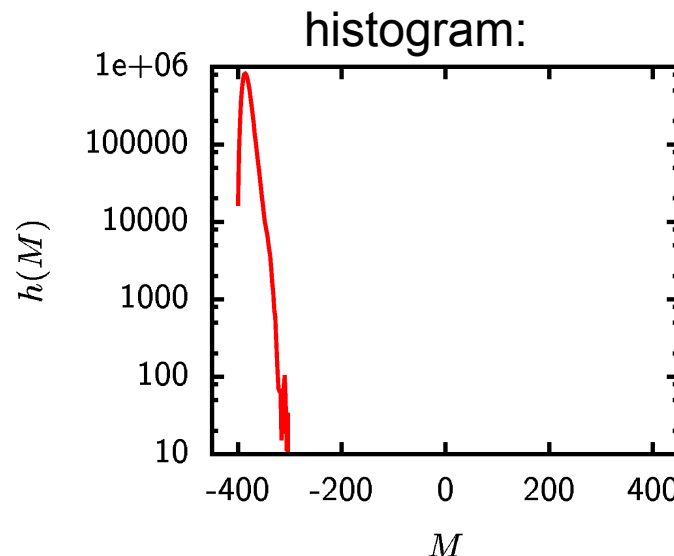
$W_0(m) = 1$

simulation

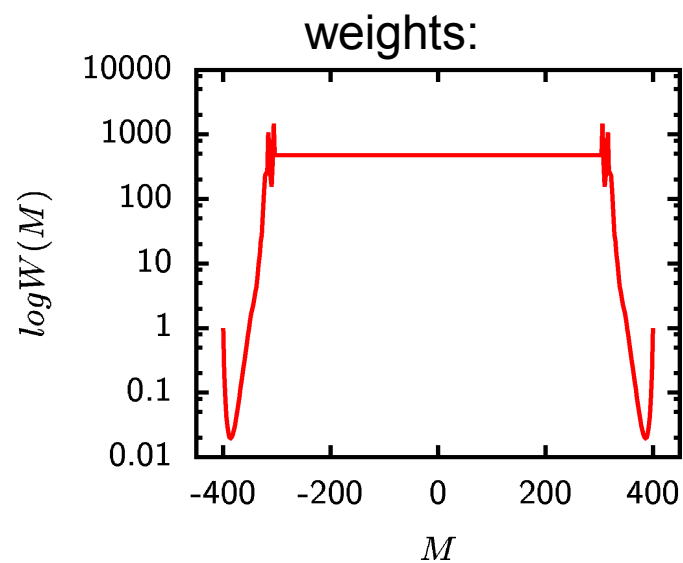
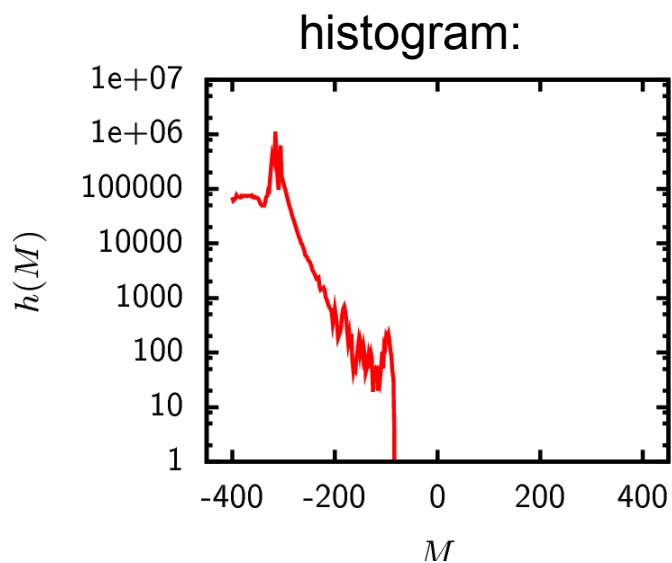
$W_{i+1}(m) = \frac{H_i(m)}{W_i(m)}$

sampling

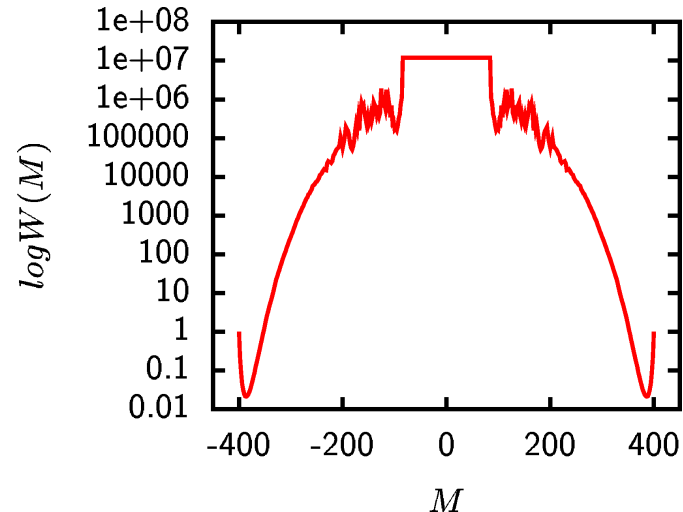
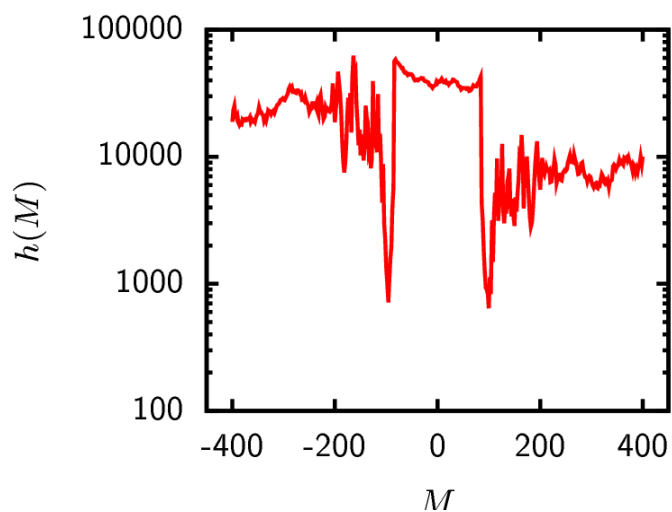
This seems to a bit strange, but it works:



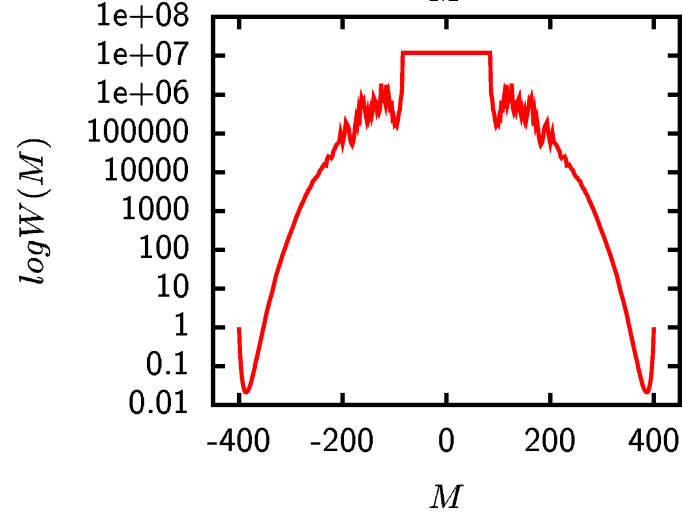
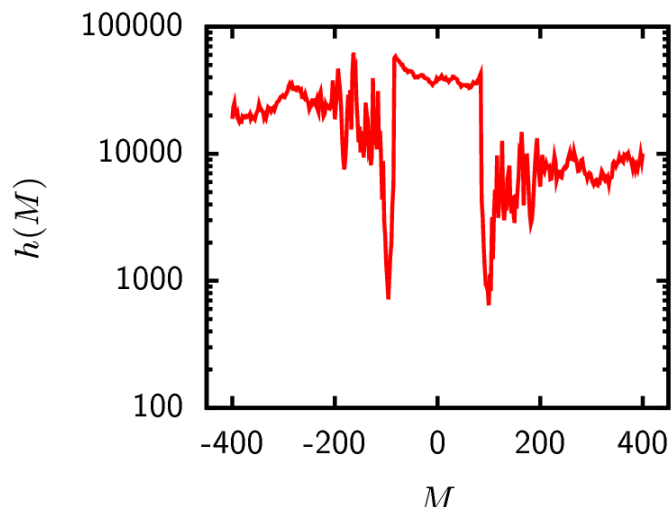
**iteration 1**



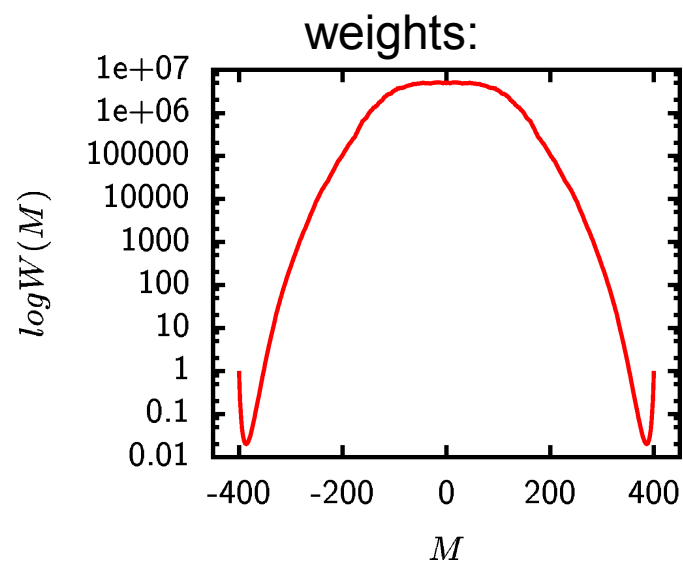
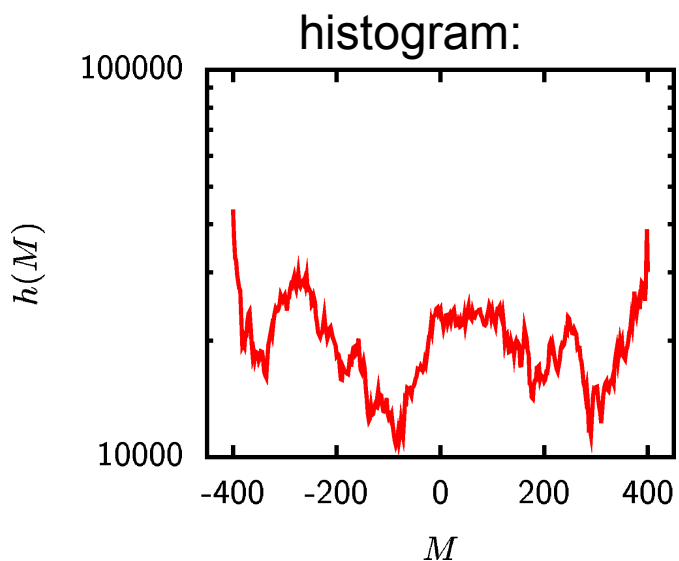
**iteration 2**



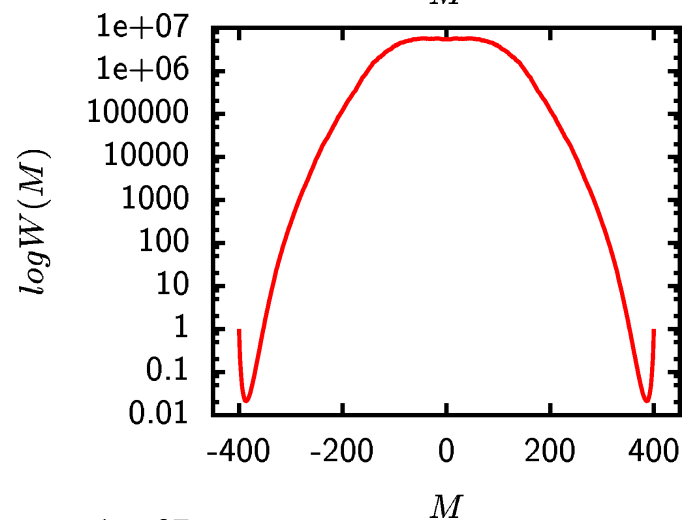
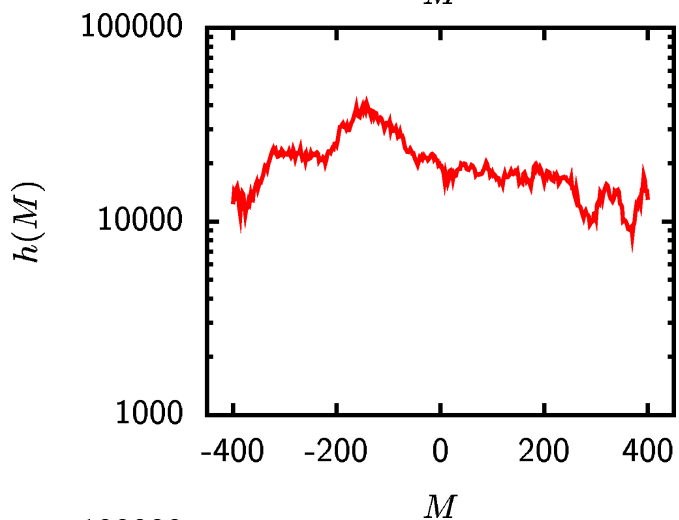
**iteration 3**



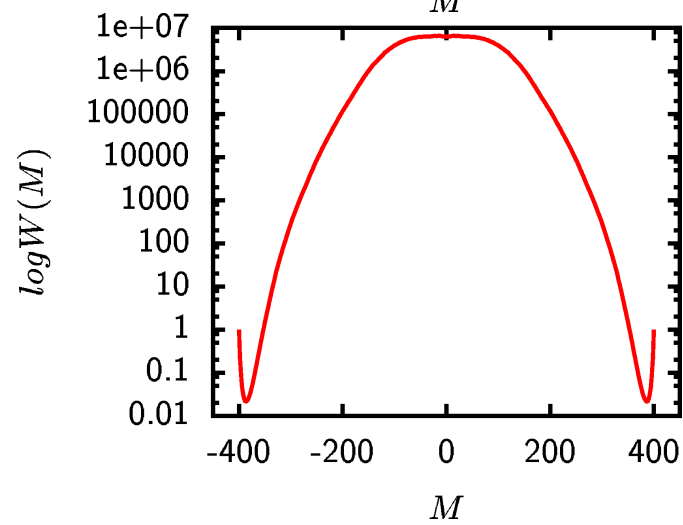
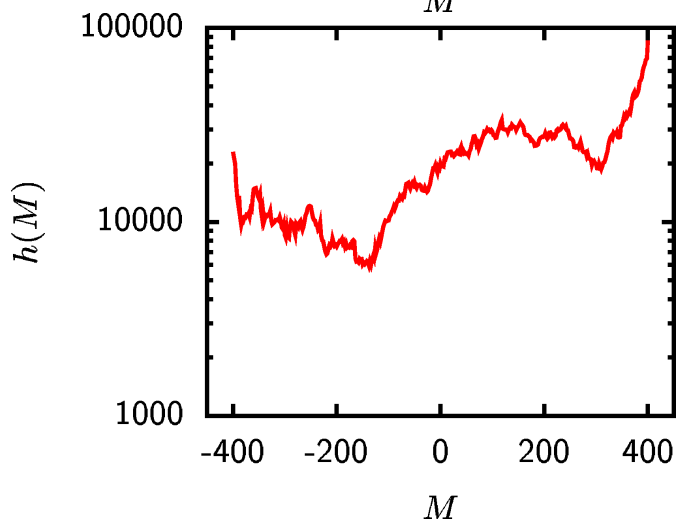
**iteration 4**



**iteration 5**



**iteration 9**



We use:

## Parallel tempering (PT) + multioverlap (MuQ)

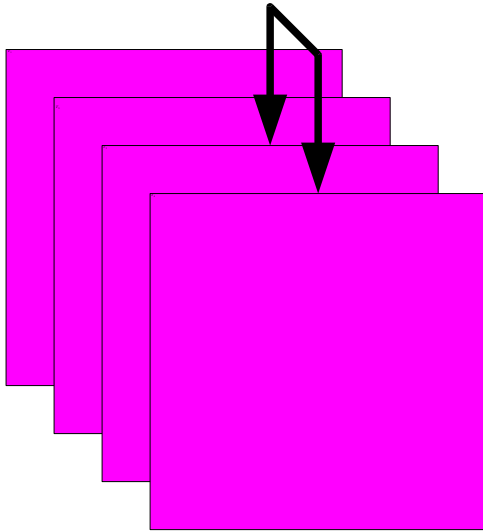
[K. Hukushima and K. Nemoto,  
J. Phys. Soc. Jpn. 65 (1996) 1604]

Idea:

Simulate larger system with  
 $N$  “replica” at different  $T$

Exchange at regular intervals  
system  $i$  and  $i+1$  with

$$P(i, i+1) = \min[1, \exp(\Delta\beta \Delta E)]$$



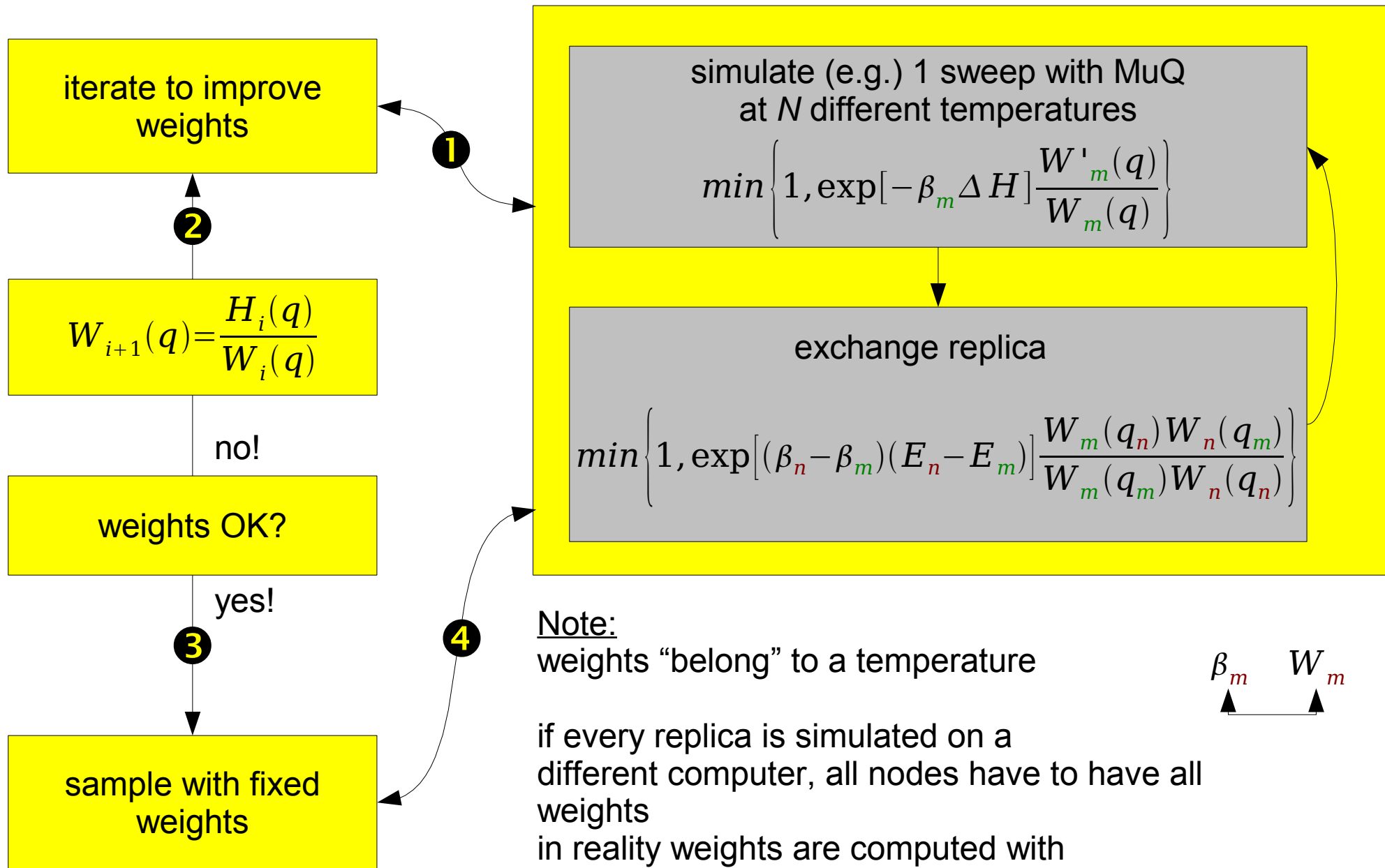
note:

- ① replica can decorrelate at high temperatures
- ② expectation values for at a specific temperature

$$\langle A \rangle_{T_i} = \langle A_i \rangle$$

- ③ there is the freedom to adjust the number of temperatures (replicas) and the values

# Now: combination of both (aka PT-MuQ)



Note:  
weights “belong” to a temperature

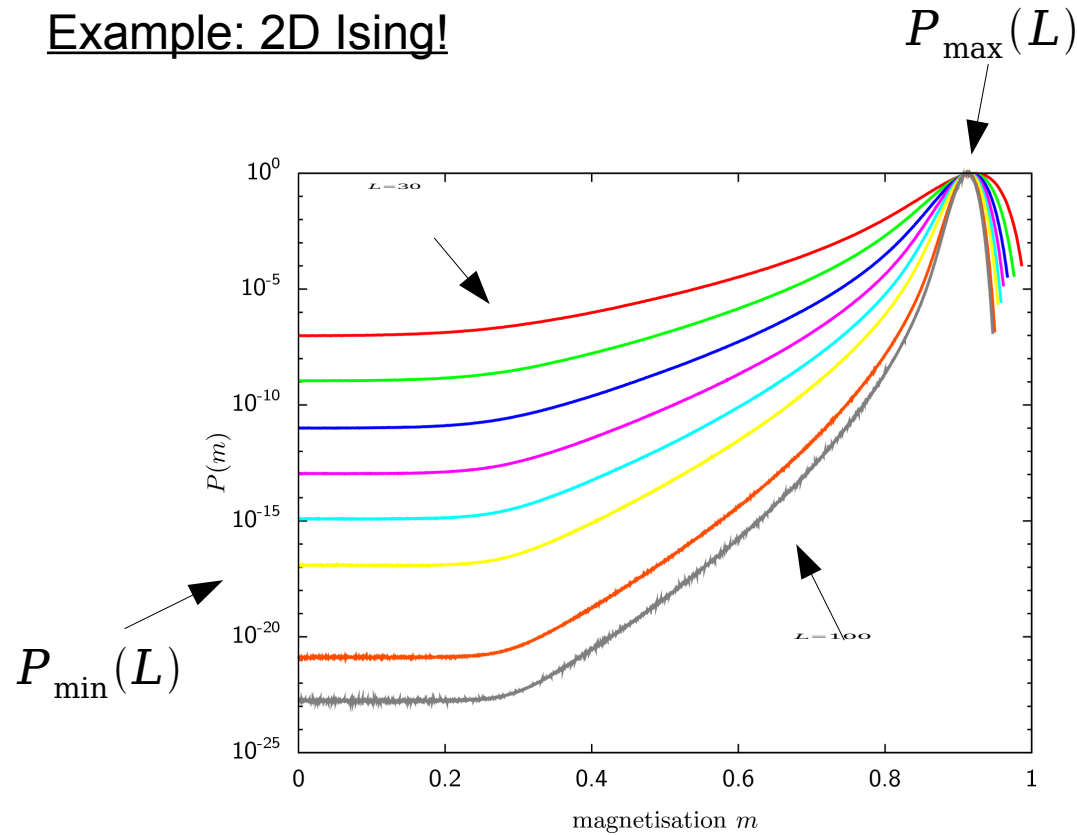
if every replica is simulated on a different computer, all nodes have to have all weights  
in reality weights are computed with a more “sophisticated” approach



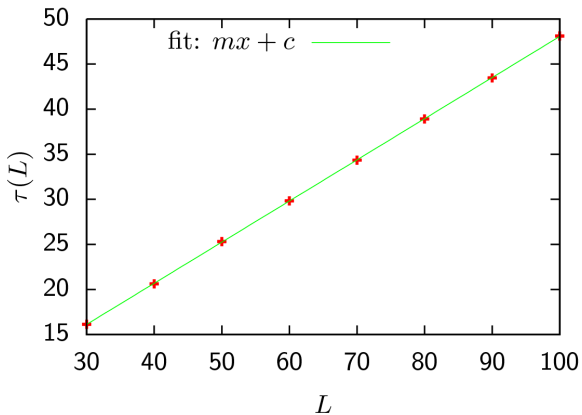


# Main objective: barrier heights

Example: 2D Ising!



$$\frac{P_{\max}(L)}{P_{\min}(L)} \sim \exp[F_B(L)] \equiv \tau(L)$$

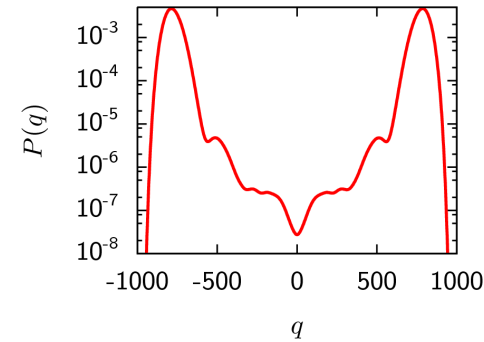
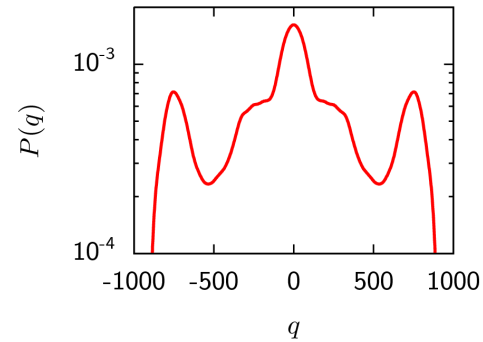
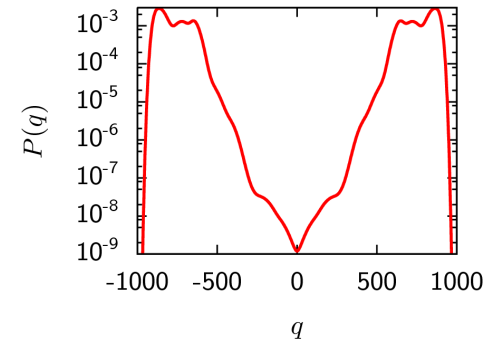
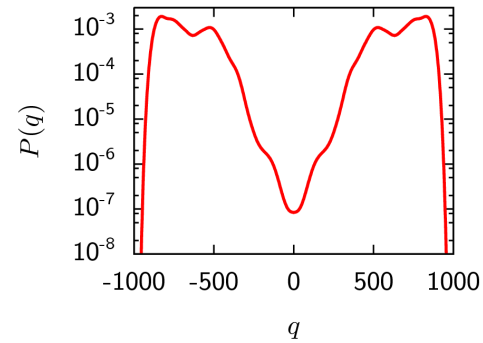


fit:  
for 2D Ising the  
function is well  
known

$$F_B \sim \sigma(L) \sim 2L$$

Spin glasses:

difficult structure, maxima/minima  
are scattered around



Question:  
how do we measure  
the size of the  
largest barrier?

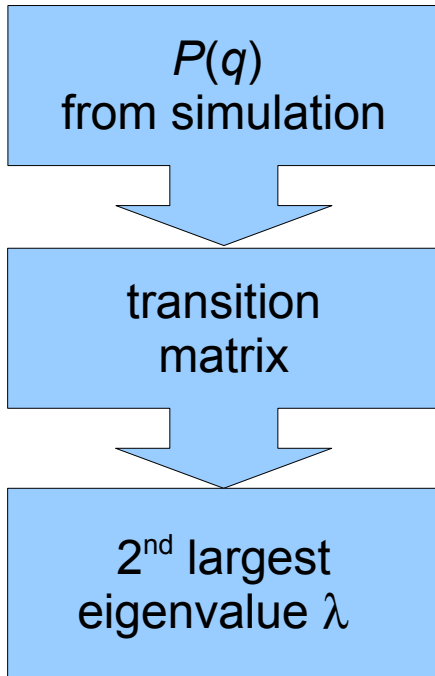
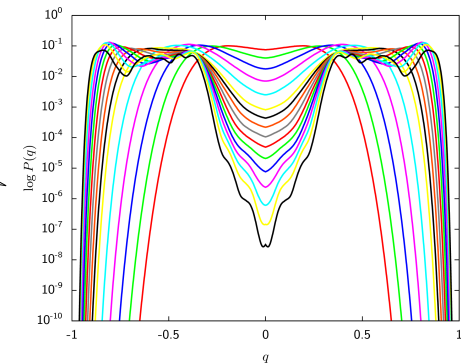
# Idea: 1d Markov chain/transition matrix

[B.A. Berg, A. Billoire and W. Janke, PRB 61 (2000), 12143]

## Definition:

$$T = \begin{pmatrix} 1 - w_{1,2} & w_{1,2} & 0 & \dots \\ w_{2,1} & 1 - w_{2,1} - w_{2,3} & w_{2,3} & \dots \\ 0 & w_{3,2} & 1 - w_{3,2} - w_{3,4} & \dots \\ 0 & 0 & w_{4,3} & \dots \\ \vdots & \vdots & \vdots & \ddots \end{pmatrix}$$

$$w_{i,j} = \frac{1}{2} \min \left[ 1, \frac{P(x_j)}{P(x_i)} \right]$$



## Simple example: random walk

flat distribution

$$P(x_i) = \frac{1}{N}$$

$$w_{i,j} = \frac{1}{2} \min \left[ 1, \frac{1/N}{1/N} \right] = \frac{1}{2}$$

$$T = \begin{pmatrix} 1/2 & 1/2 & 0 & \dots \\ 1/2 & 0 & 1/2 & \dots \\ 0 & 1/2 & 0 & \dots \\ 0 & 0 & 1/2 & \dots \\ \vdots & \vdots & \vdots & \ddots \end{pmatrix}$$

autocorrelation time for  $q$ :

$$\tau_B = \frac{1}{N \log \lambda}$$

free energy barrier:

$$F_B \equiv \log \tau_B$$

with equilibrium  
distribution

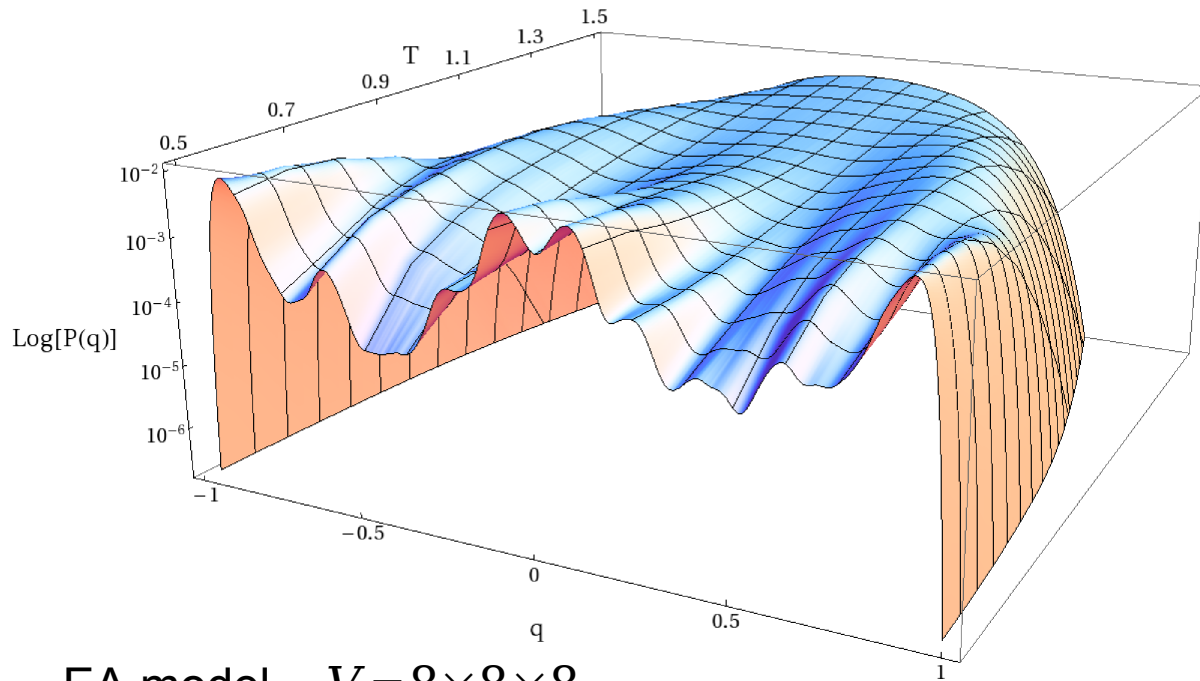
$$A = \begin{pmatrix} 1/n \\ 1/n \\ \vdots \end{pmatrix}$$

follows

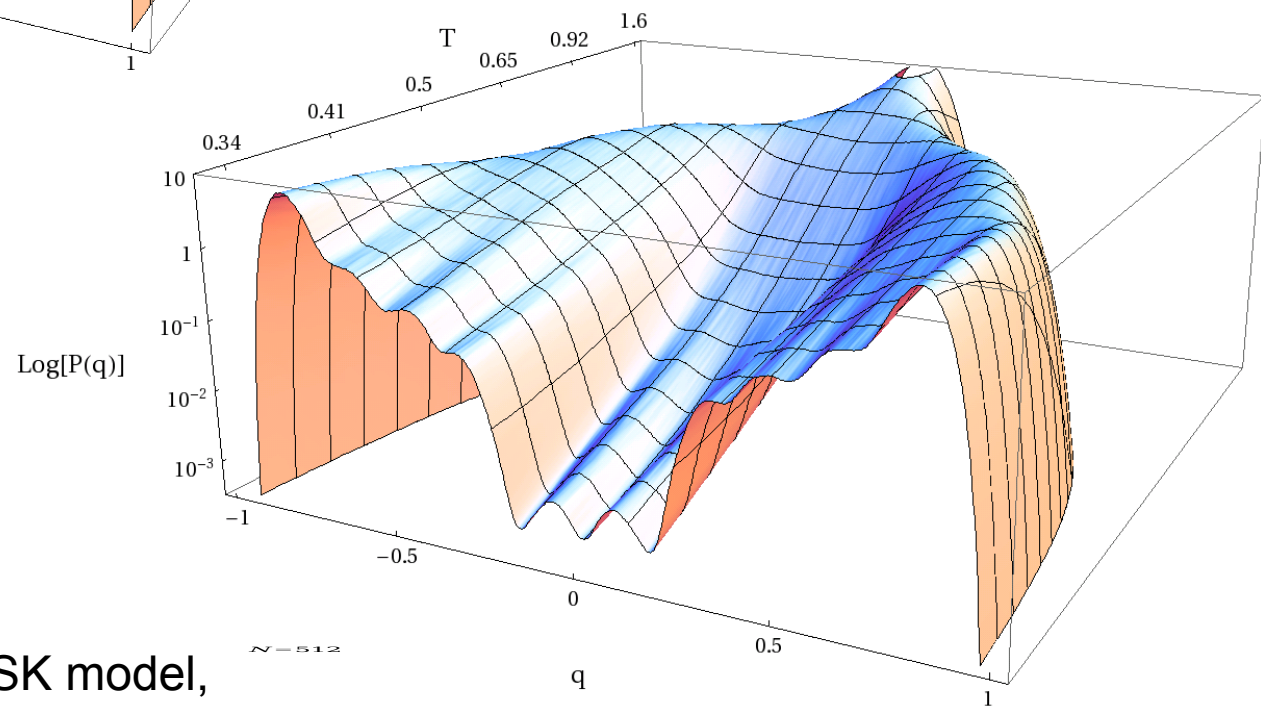
TATA



# Results 1a: Distribution $P_J(q, T)$ for **ONE** set of couplings



EA model,  $V = 8 \times 8 \times 8$



SK model,

$$P(q) = \left[ \sum_{ab} P_a \cdot P_b \cdot \delta(q - q_{ab}) \right]_J$$

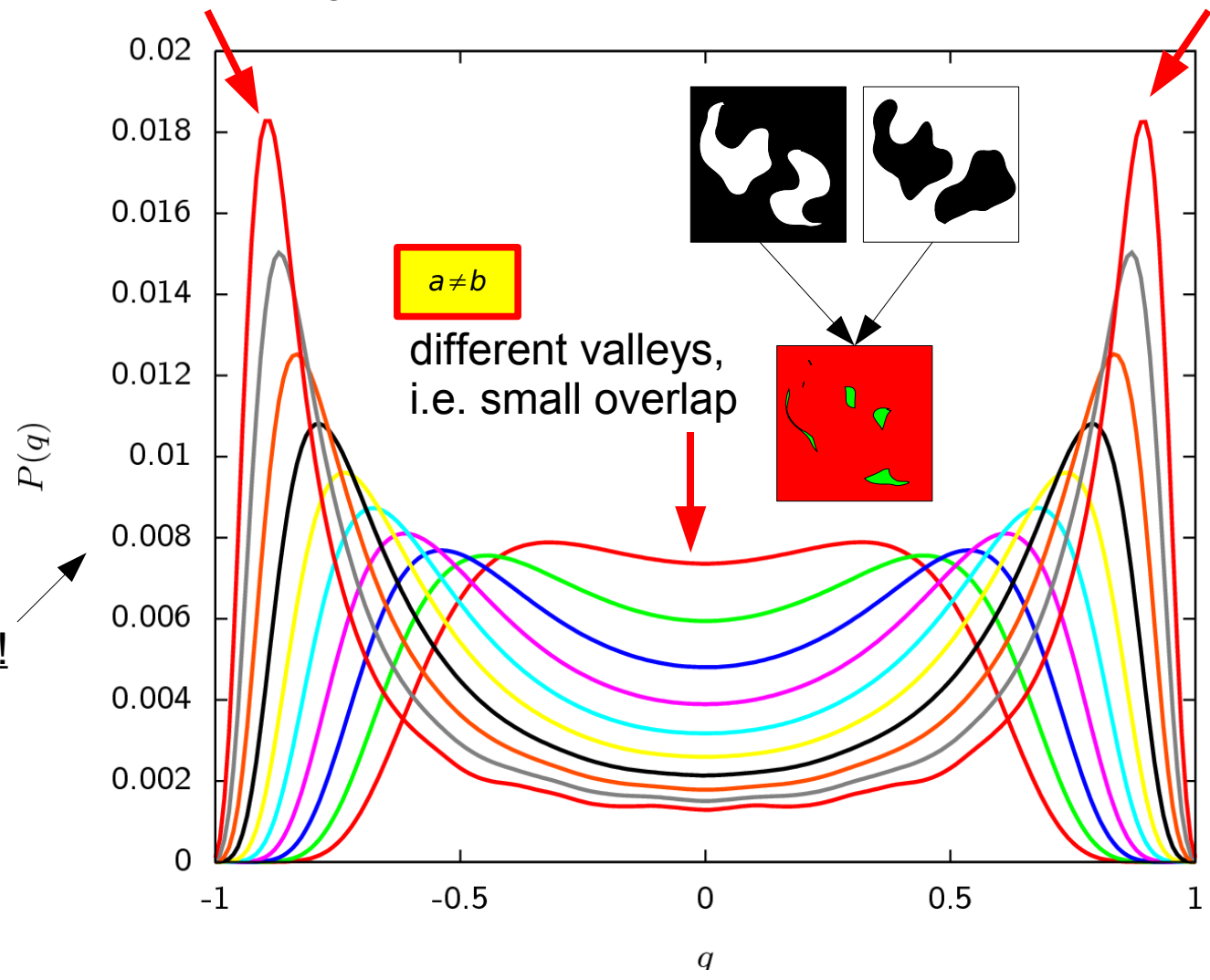
Result 1b: What does the average distribution of the EAI model look like?

↑  
over the different couplings

$$\bar{a} = b$$

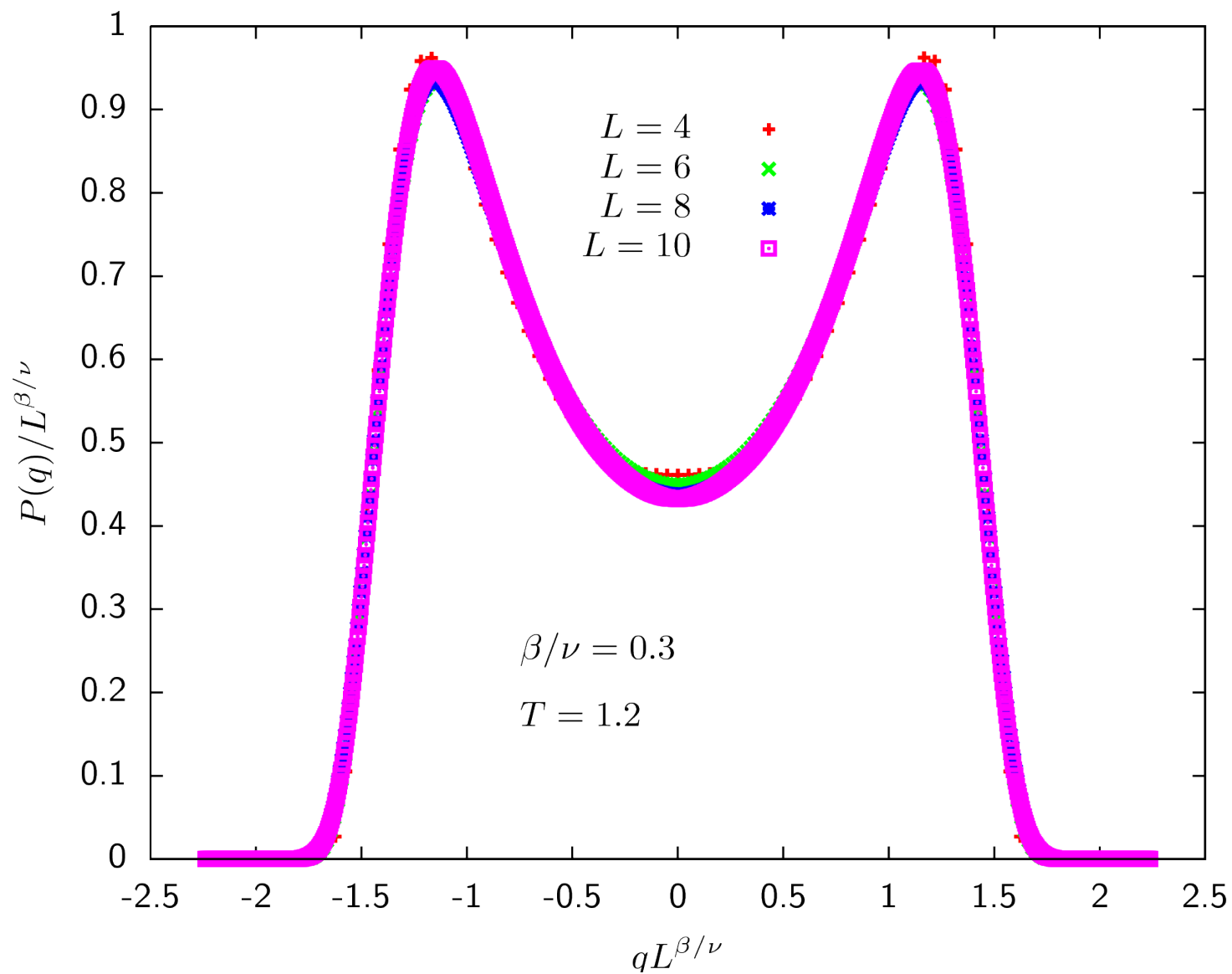
same valley,  
i.e. large overlap

total inversion (of all spins)  
of one system compared to right peak



note the scale!  
 $P(m)$  of Ising  
model has  
log-scale

# Result 1c: FSS (just for fun & 'cause its free ...)

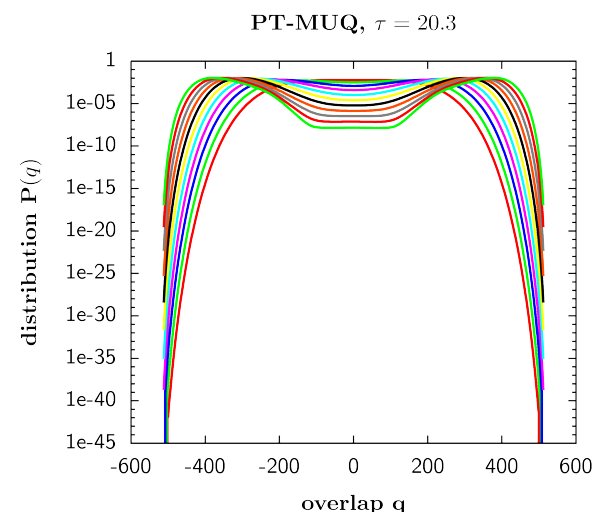
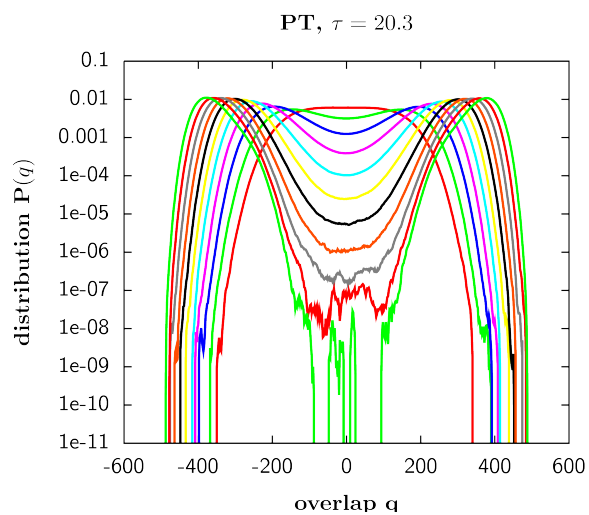
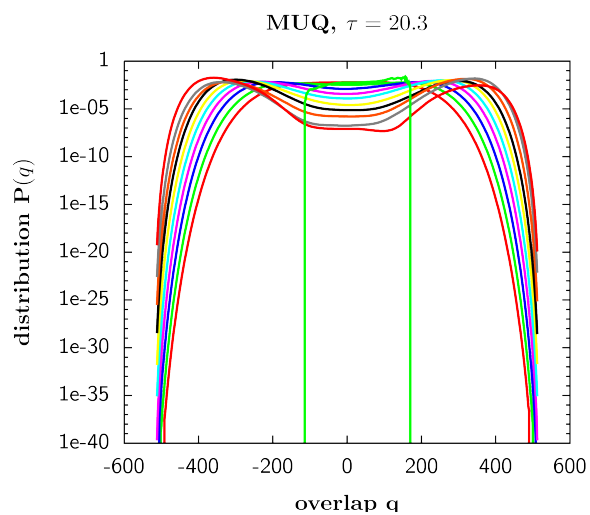
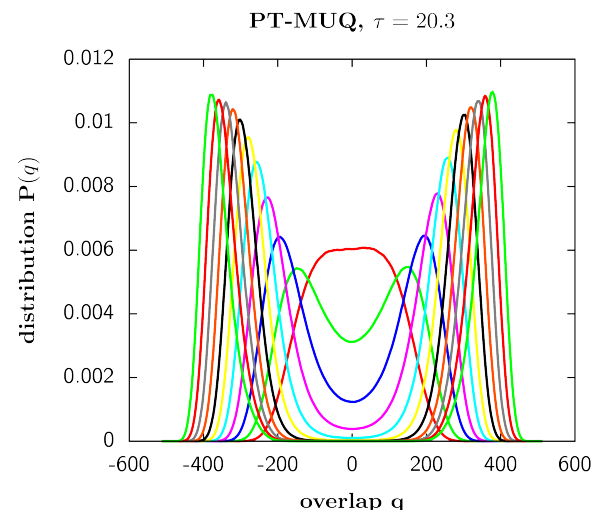
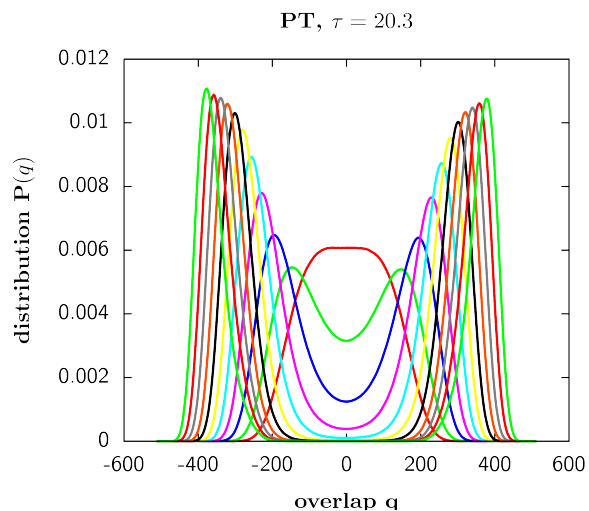
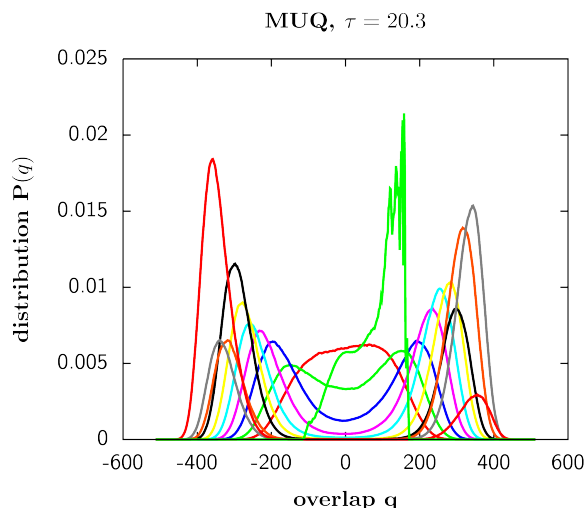


# configuration (couplings) with large autocorrelation time

## MUQ

## PT

## PT-MUQ

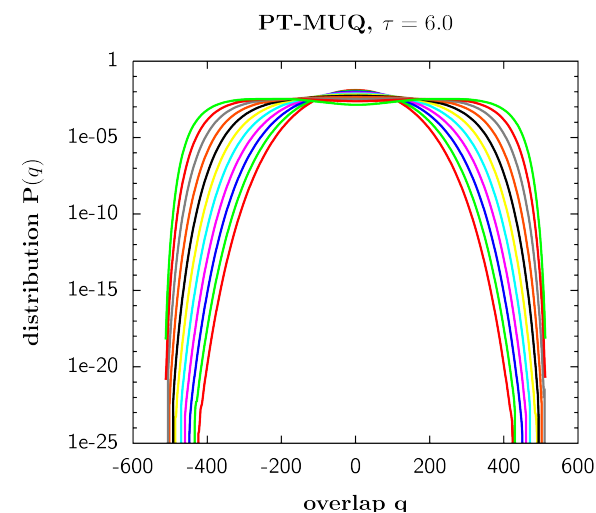
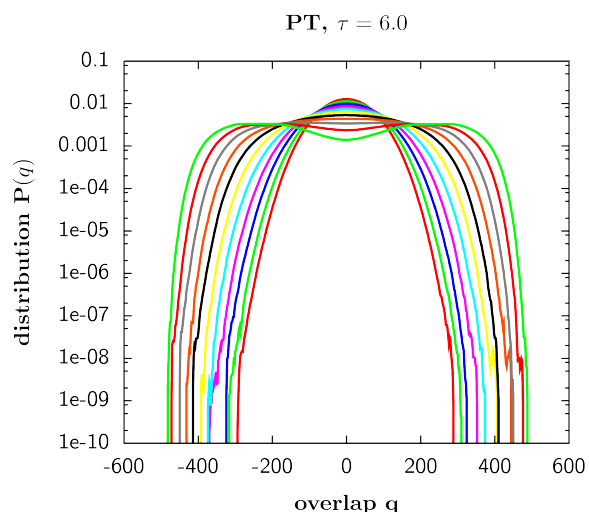
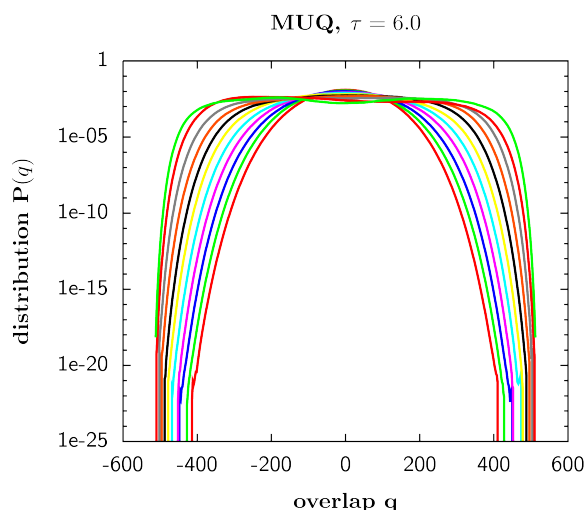
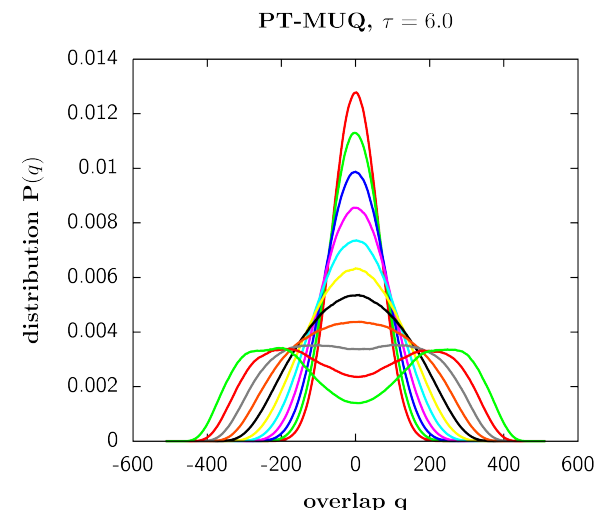
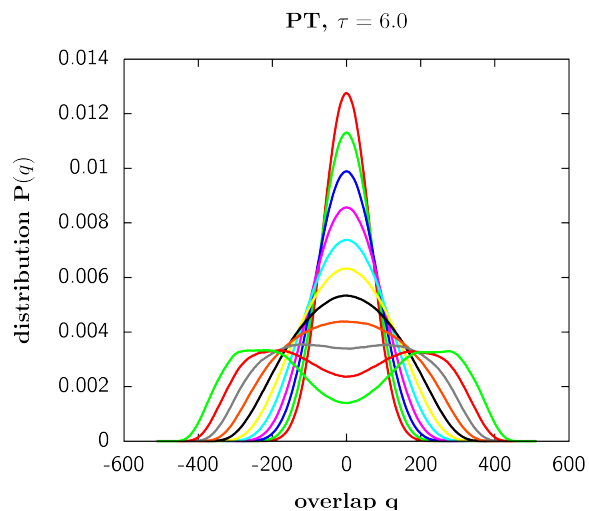
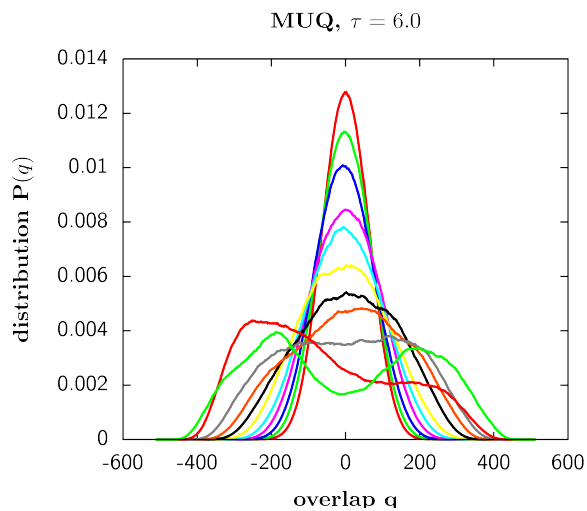


# configuration (couplings) with large autocorrelation time

## MUQ

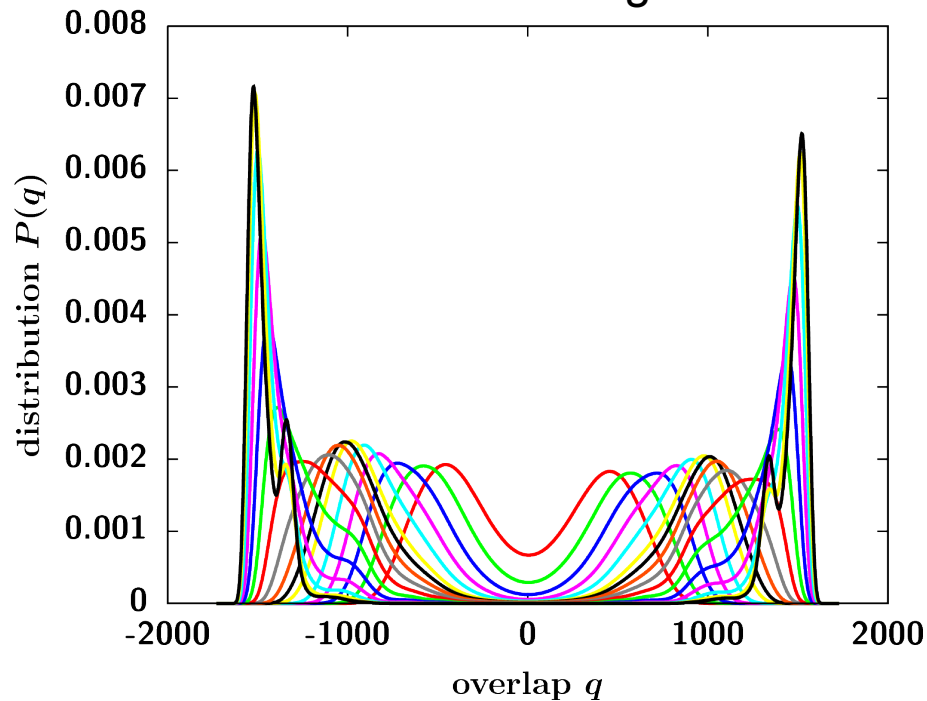
## PT

## PT-MUQ

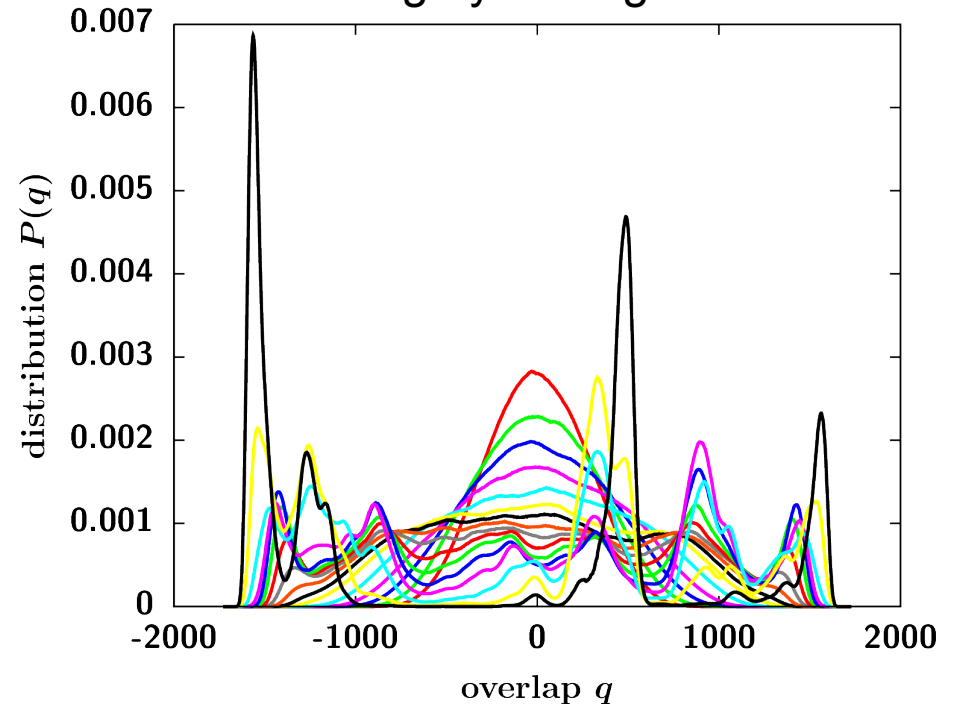


# Resistance is futile?

“well behaved” configuration



“naughty” configuration



## Quality criterion:

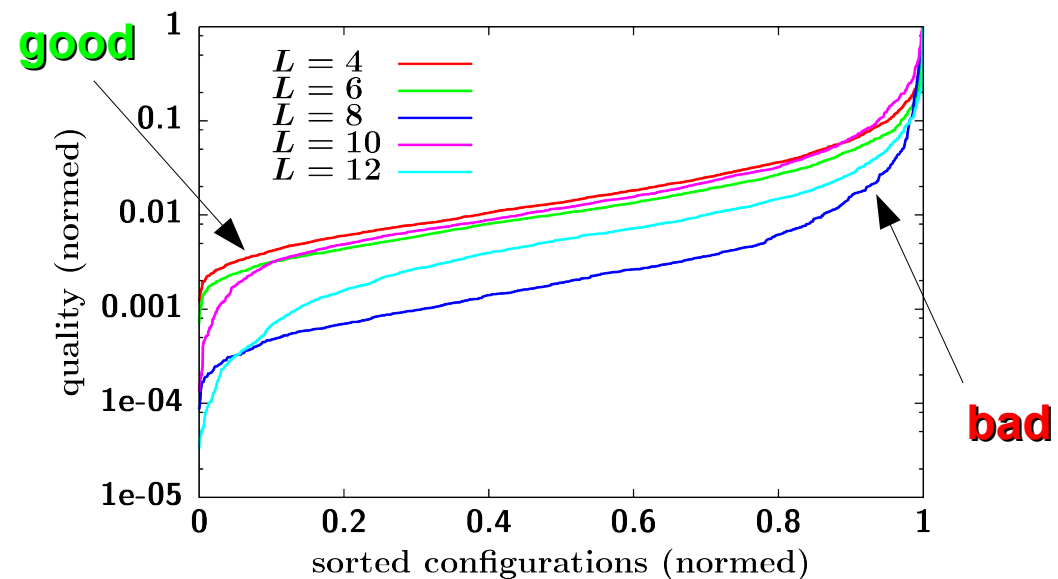
without PT: tunneling events  
with PT: ?

Idea: quadratic difference from the mean:

$$\bar{P}(q) = \frac{P(q) + P(-q)}{2}$$

left:  $[P(q) - \bar{P}(q)]^2 = \frac{1}{4} [P(q) - P(-q)]^2$

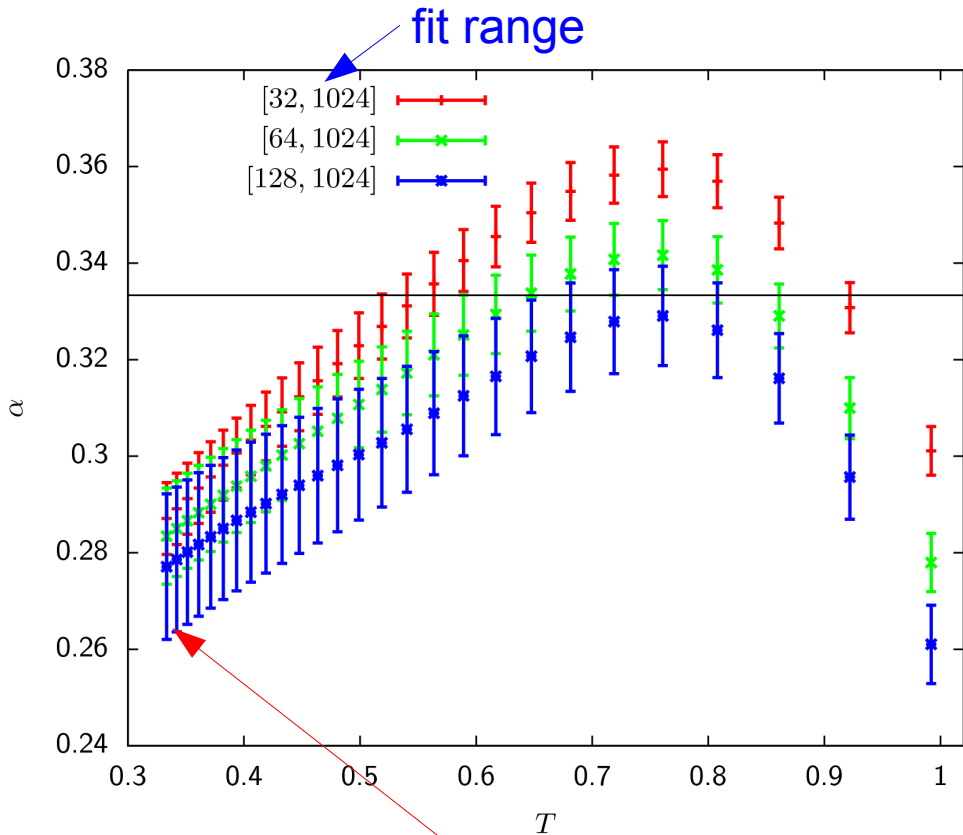
right:  $[P(-q) - \bar{P}(q)]^2 = \frac{1}{4} [P(q) - P(-q)]^2$





# Results 2: FSS fit of $F_B = \log \tau_B$

A) SK model: [E. Bittner, W. Janke, EPL 74 (2006) 195]



non-self-averaging (SK)

[L.A. Pastur and M.V. Shcherbina, J. Stat. Phys. 62 (1992) 1]

Analytic result:

[H. Kinzelbach and H. Horner, Z. Phys. B 84 (1991) 95]

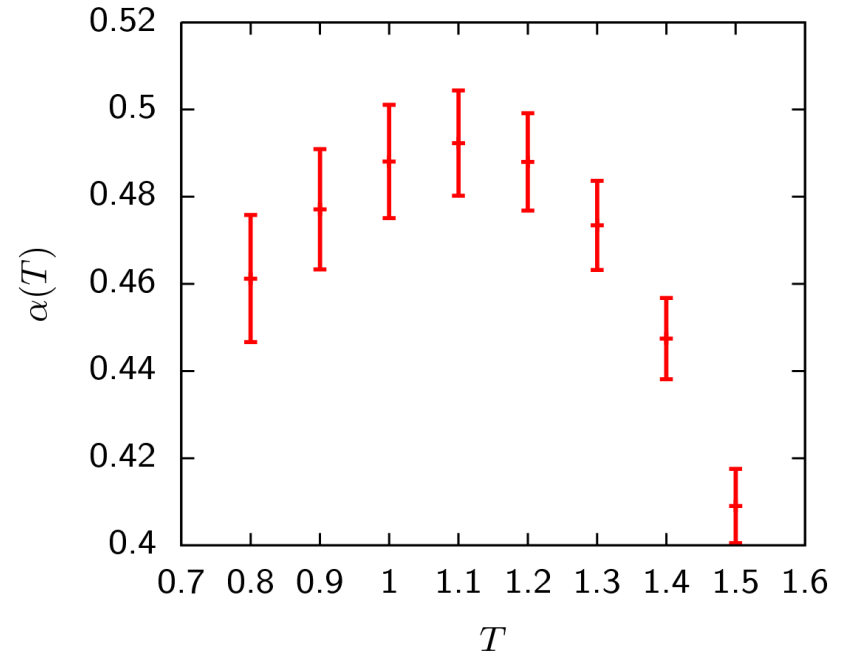
$$\tau_B \propto \exp(cN^\alpha)$$

$$\alpha = \frac{1}{3}$$

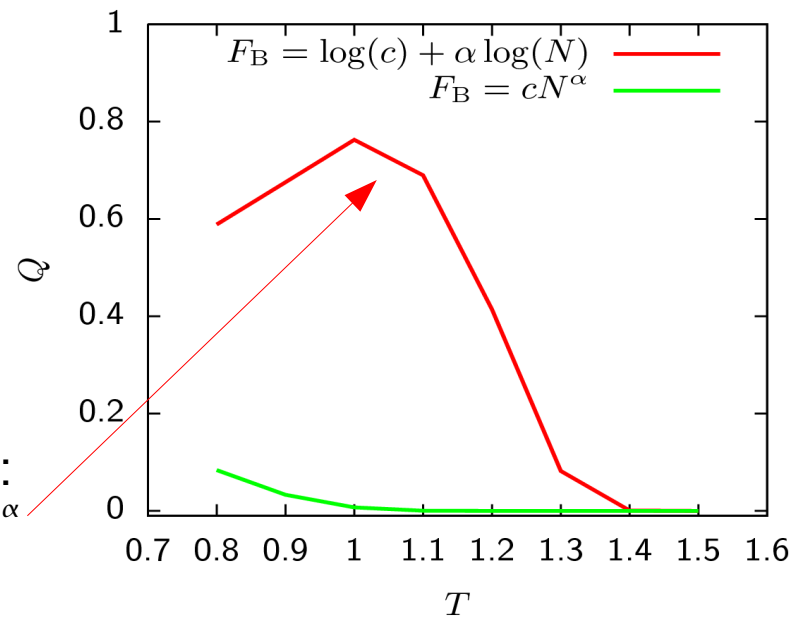
therefore, different fit:

$$\tau_B \propto cN^\alpha$$

B) EAI model:



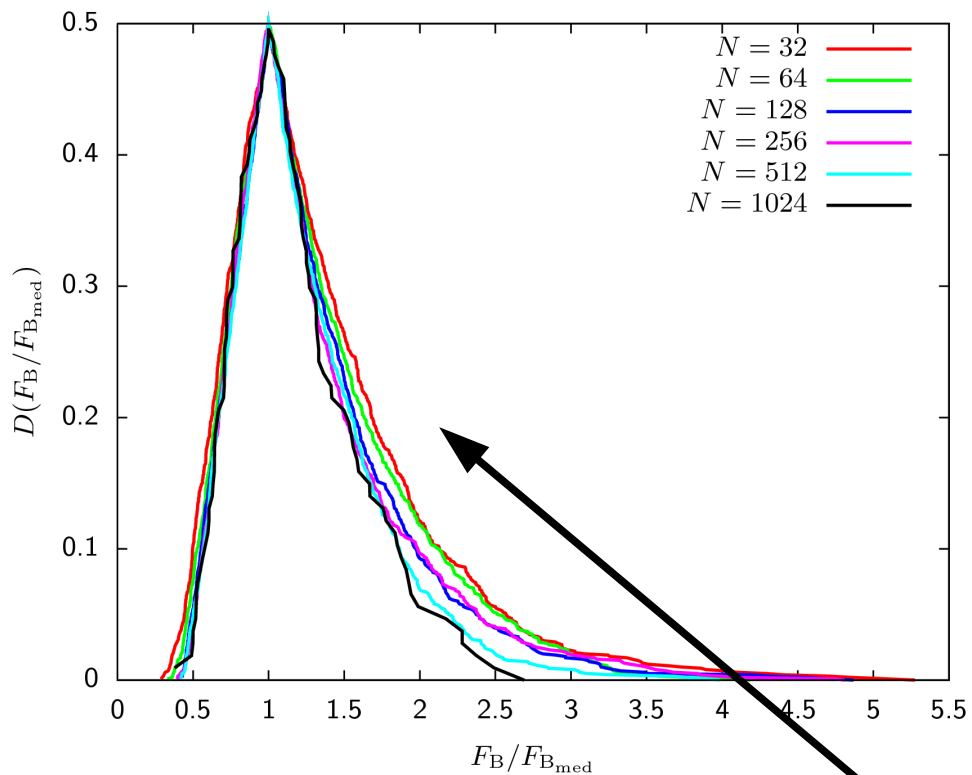
but goodness of fit ...



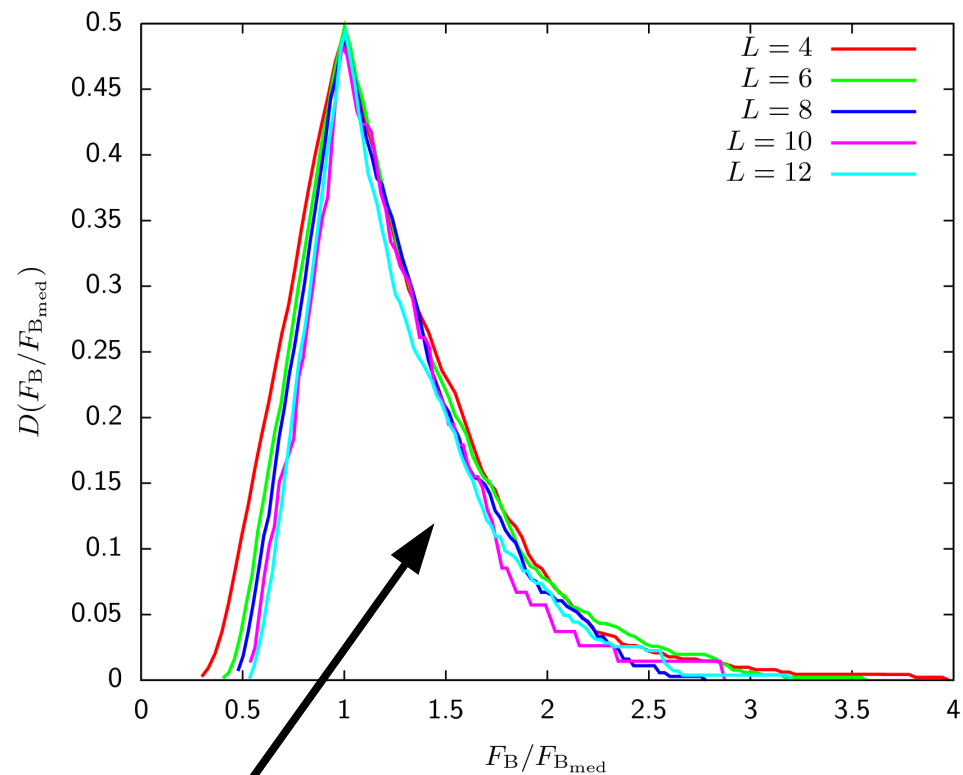
# Results 3: Peaked probability distribution

$$D(F_B/F_{B_{\text{med}}})$$

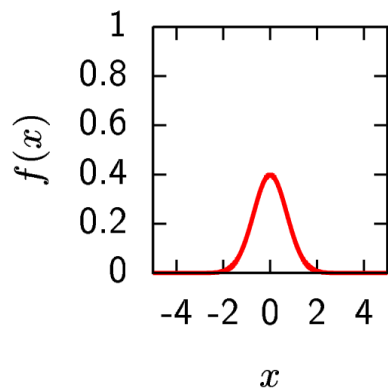
A) SK model



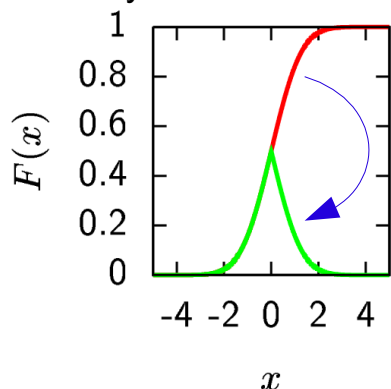
B) EA model



probability density:

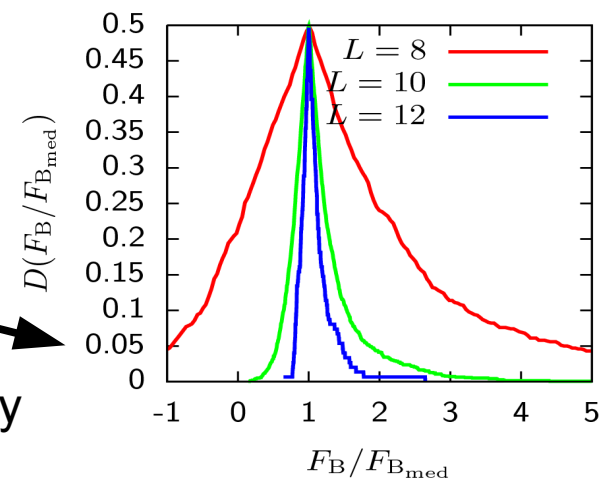


integrated probability density:



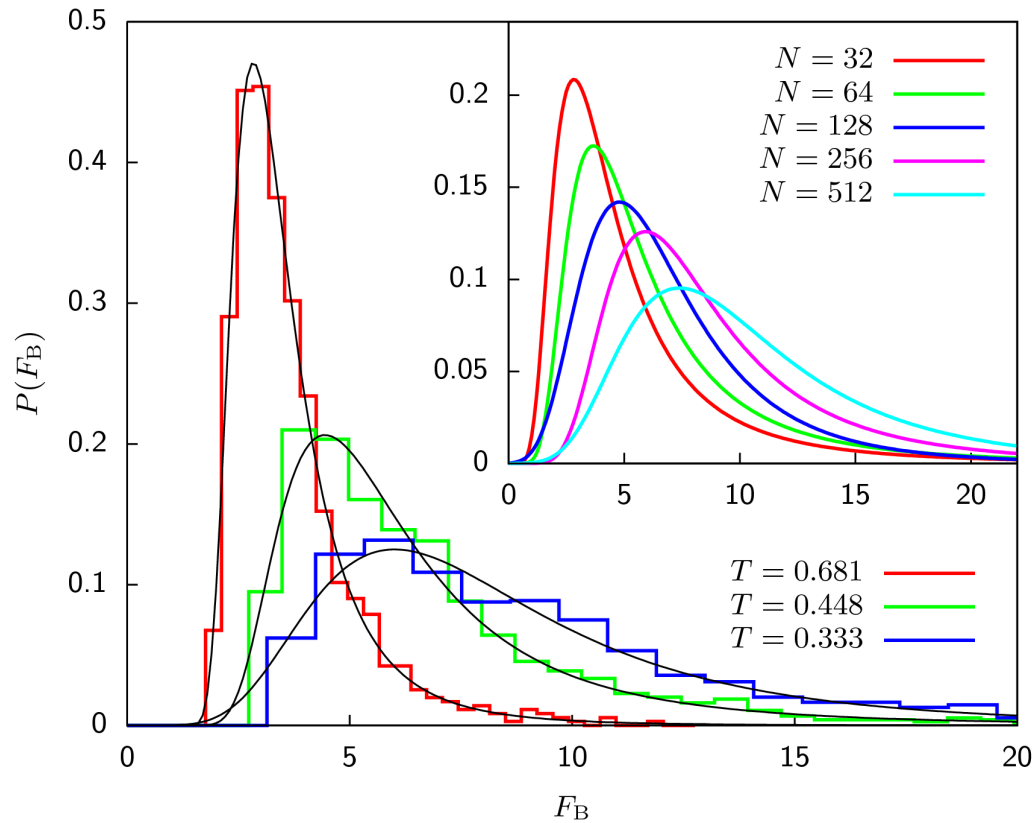
no scaling,  
i.e. no selfaveraging!

in contrast:  
barrier size  
in energy is  
selfaveraging quantity

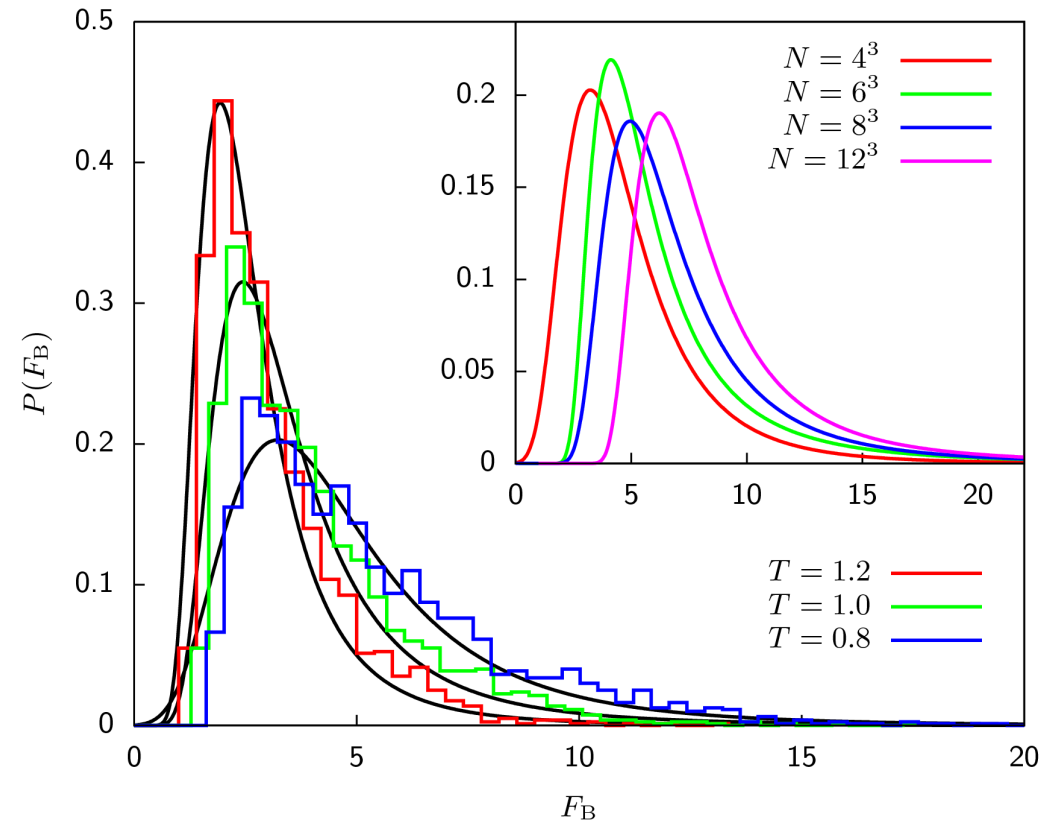


# Results 4: Probability density distribution of the barrier sizes $F_B$

A) SK model



B) EA model



Fit integrated probability density:

$$F_{\xi; \mu; \sigma}(x) = \exp \left[ - \left( 1 + \xi \frac{x - \mu}{\sigma} \right)^{-1/\xi} \right]$$

$$T < T_c \longrightarrow$$

$$\xi > 0$$

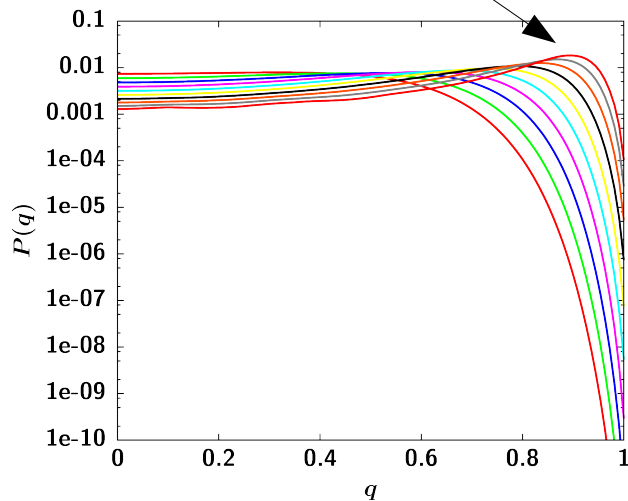
fat tailed (algebraic)  
Fréchet distribution

# Results 5: Functional form of the overlap distribution

$$P(q) = c_0 e^{-c_1 N (q - q_{max}^\infty)^x}$$

for  $q > q_{max}^\infty$

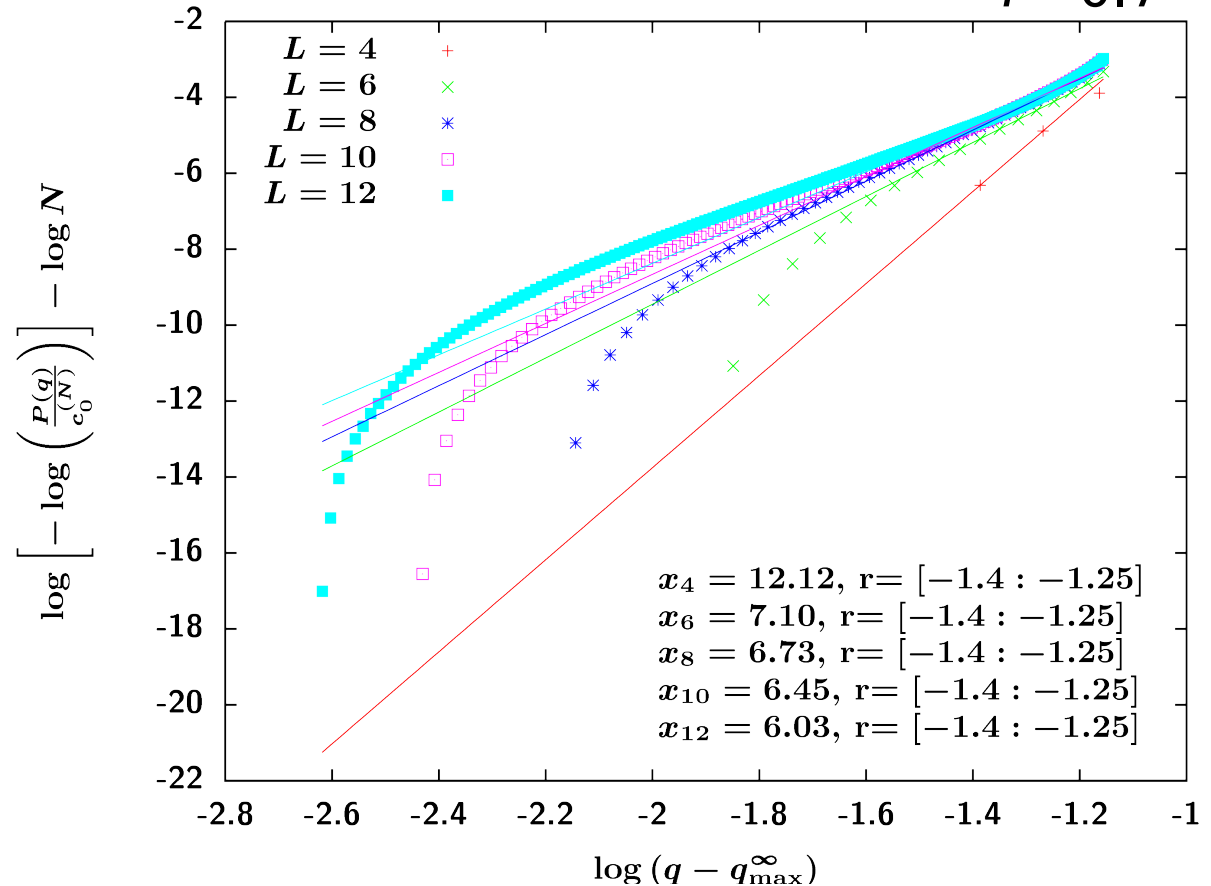
mean-field (Parisi):  $x=3$   
 3D (Moore):  $x=6$  (?)



2xlog, then fit:

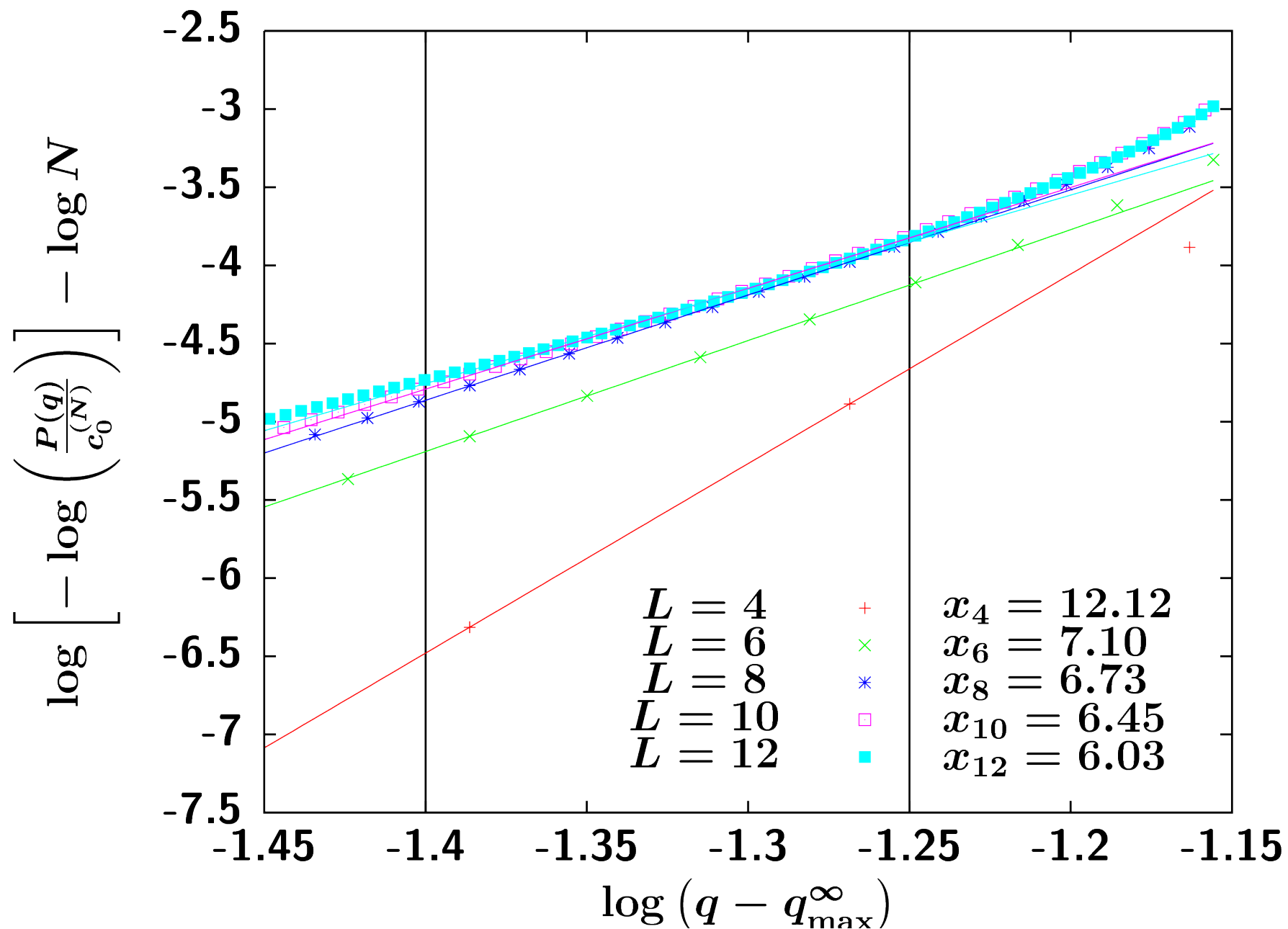
$$\ln \left[ -\ln \left( \frac{P(q)}{c_0^{(N)}} \right) \right] - \ln(N) = \ln c_1 + x \ln(q - q_{max}^\infty)$$

$T=0.7$



quality of the fit:  
 consistent fits can be  
 only achieved over a  
 “somewhat” restricted  
 range

Zoom of the last plot:



# Conclusions:

## A) Algorithmic

PT is good to decrease the autocorrelation time  
MuQ gives the full  $P(\text{information})$   
The combination of PT+MuQ makes it possible  
to get  $P(\text{down to } T \approx 0.5 T_c)$

## B) Physical

the free energy barriers of the SK and EA model are  
a) non-self-averaging  
b) follow the Fréchet extreme-value distribution  
the free energy barriers of the SK model diverge  
with an exponent of  $\alpha = 1/3$   
the last is not true for the EA model!

**A) Thank you for your attention!**

**B) Publications:**

B. Berg, A. Billoire and W. Janke

Phys. Rev. Lett., 80 (1998) 4771

B. Berg, A. Billoire and W. Janke

Phys. Rev. B., 61 (2001) 12143

E. Bittner, W. Janke,

“Free-energy barriers in the Sherrington-Kirckpatrick Model”

Europhys. Lett, 74 (2006) 195

E. Bittner, A. Nußbaumer and W. Janke

“Free-energy barriers of spin glasses”

in NIC Symposium 2008, edited by G. Münster, D. Wolf, M. Kremer,  
NIC Series, Vol. 39, 221 (2008)

**C) Work is supported by:**

Deutsche Forschungsgemeinschaft

EU-RTN Network “ENRAGE”

Computer time: NIC, FZ-Jülich

# Supplement 1:

## Finite temperature transition in 3D: Yes/No?

**Yes**

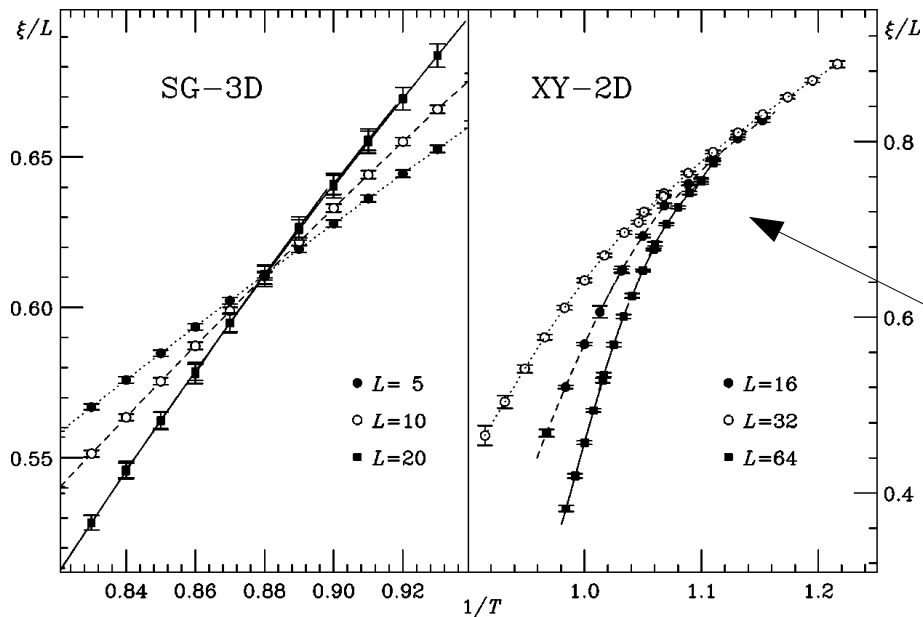
$$T \approx 1.1$$

$$g_{sg} \approx 0.75$$

## Universality class: 2<sup>nd</sup> order/BKT

Correlation length divided by system size:

Early MC [Bhatt and Young, PRL 54 (1985) 924]:  
line of critical points terminating  
at  $T=1.2$  similar BKT in 2D XY



[H. G. Ballesteros et al., PRB 62 (2000) 14237]

Berezinskii-Kosterlitz-Thouless (BKT)  
transition

**“simple” 2<sup>nd</sup> order transition**



# Four dimensions or higher?

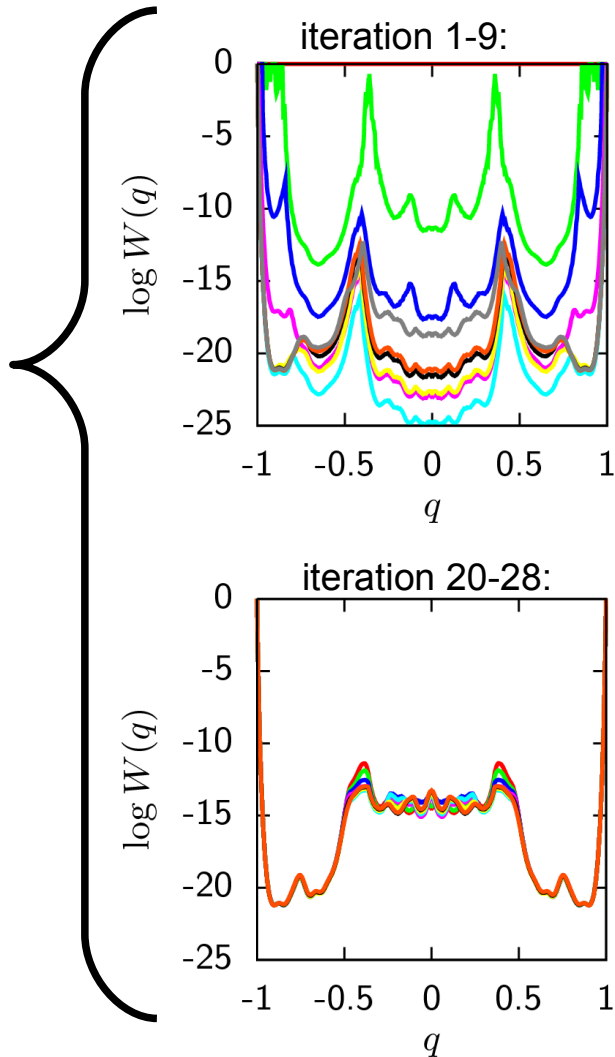
Simpler to simulate (well separated from the lower critical dimension)

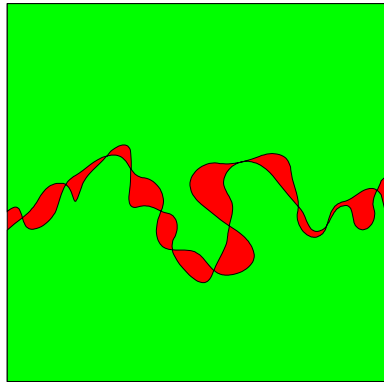
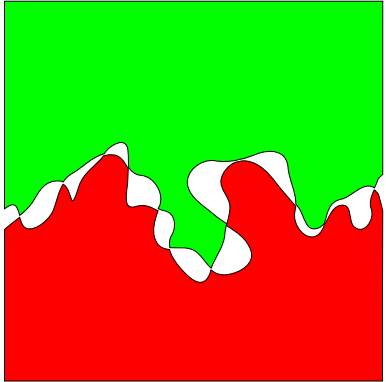
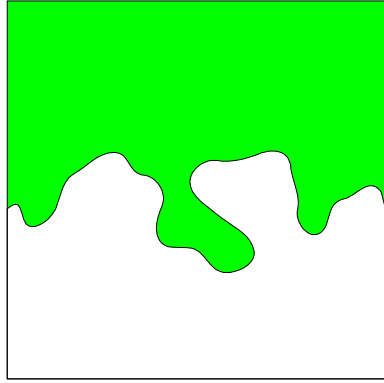
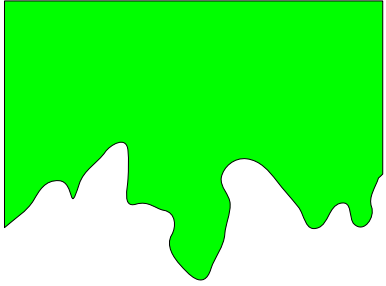
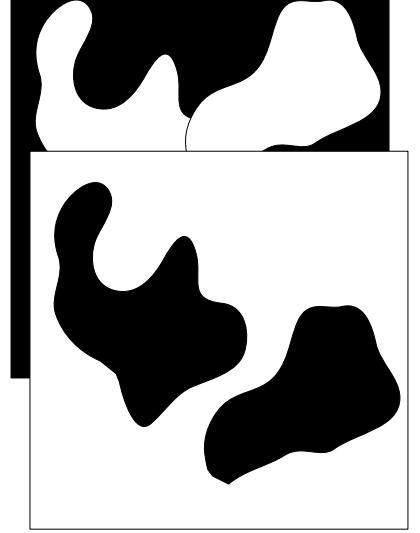
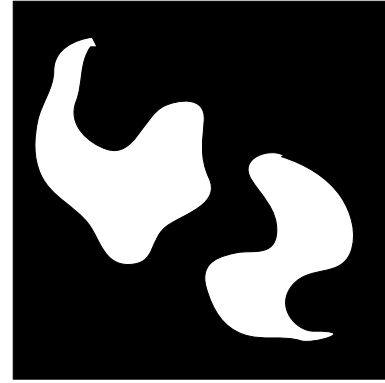
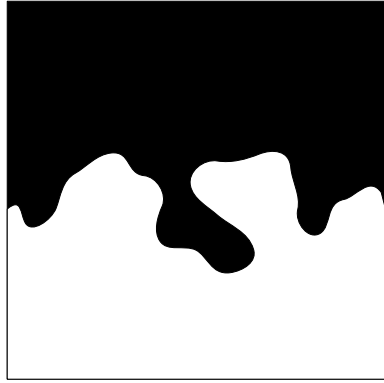
Finite-temperature well established ( $T_c \sim 1.75$ ) by Binder-parameter crossing

# Supplement 2:

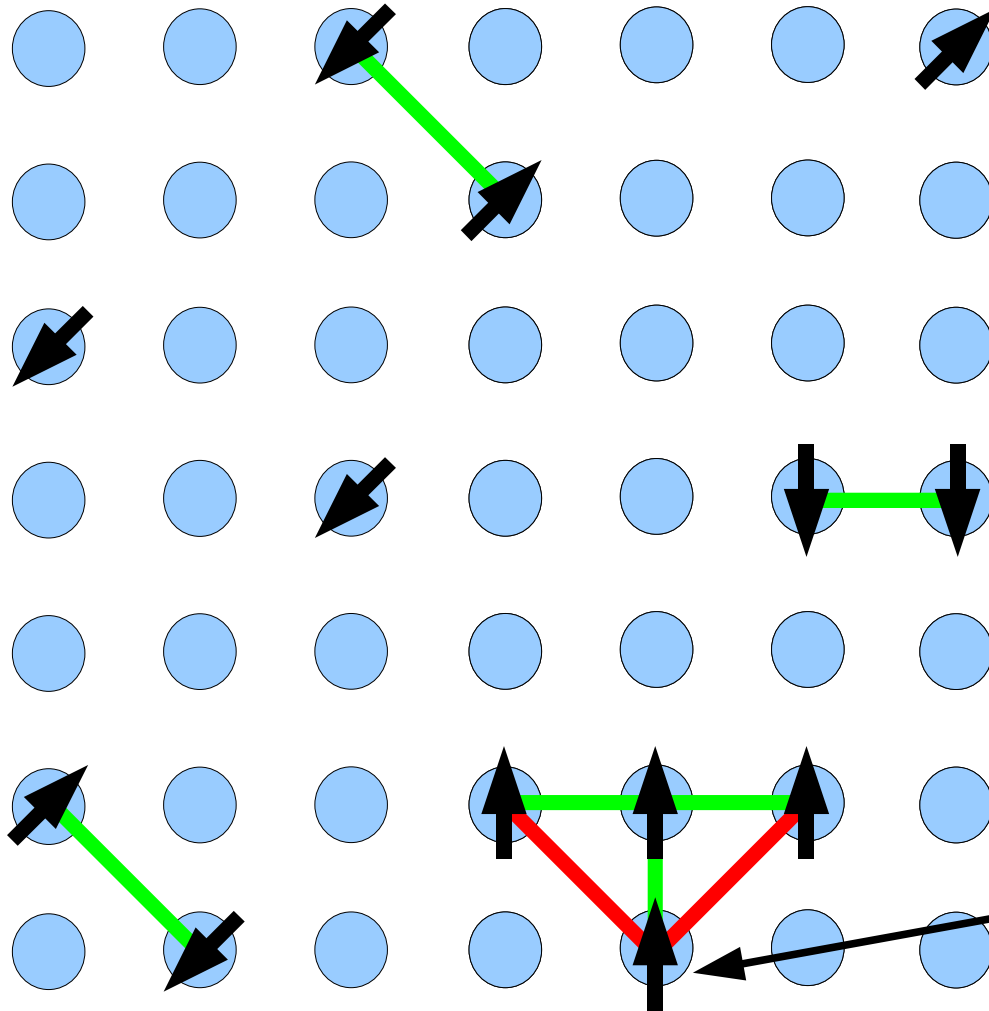
## Do the weights saturate?

**Yes**





# And the explanation?



T is very low,  
doping around 30%,  
n.n.: ferromagnetic  
 $J_1 > 0$   
n.n.n: antiferromagnetic

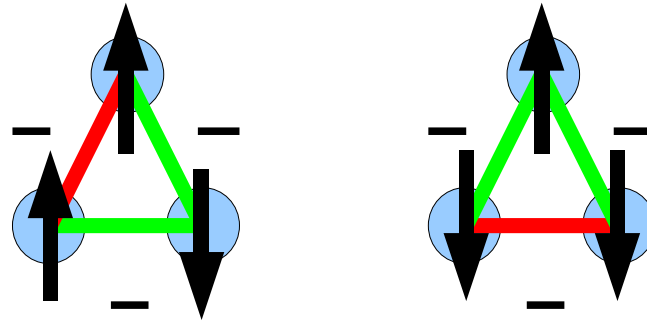
$$J_2 < 0$$

Sketch:  $J_1 = 2|J_2|$

frustration of the lower spin:  
cannot decide if he wants to satisfy  
n.n. neighbour by  $\blacktriangledown$   
or n.n.n. neighbours by  $\blacktriangle$

# Is frustration sufficient for a spin glass?

**NO!** Counter example:  
antiferromagnetic triangular lattice



here:  
4 other (symmetric  
configurations)

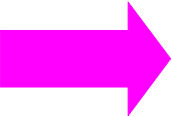
fully frustrated

no co-operative freezing transition (Mydosh: slow  
blocking to ground state with large mag. fluctuations)

➡ Add: **mixed interactions**, i.e.  
ferromagnetic ( $J > 0$ ) and antiferromagnetic ( $J < 0$ )

# Enough?

**NO!** Counter example:  
Kagome lattice

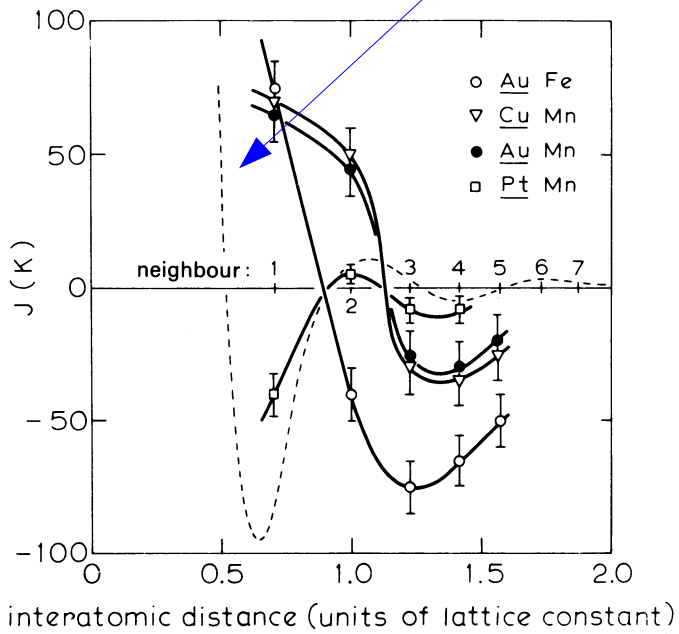
 Add: **randomness/disorder**, i.e.  
site randomness = distribution of distances  
between spins  
bond randomness = nearest-neighbour  
interaction varies (+/-J)

Finally: **randomness + mixed interaction**

*can* lead to **frustration**  **spin glass**

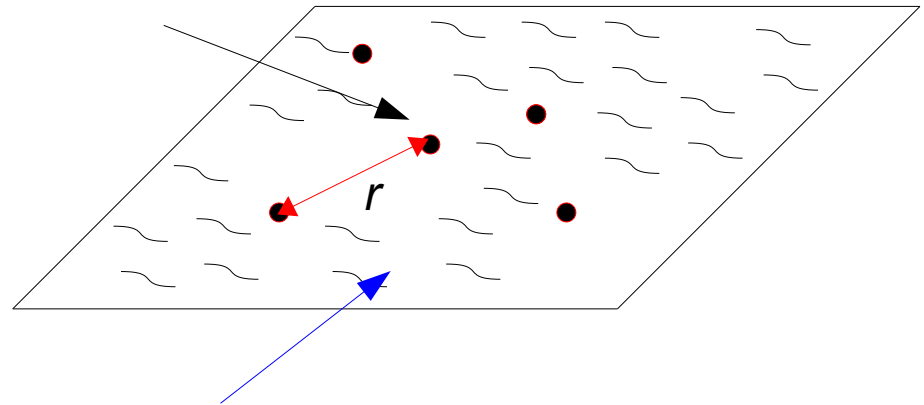
# RKKY = Ruderman, Kittel, Kasuy, Yosida

Hamiltonian:  $H = J(2k_F r) \sigma_i \sigma_j$        $J(x) = J_0 \frac{\cos(x)}{x^3}$



from: Morgownik and Mydosh (1983)

impurities, e.g. Fe, Mn, ...



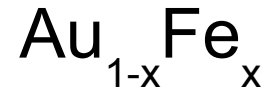
sea of conduction electrons from non-magnetic metal host-matrix, e.g. Au, Cu, Pt, ...

# How to create randomness ?

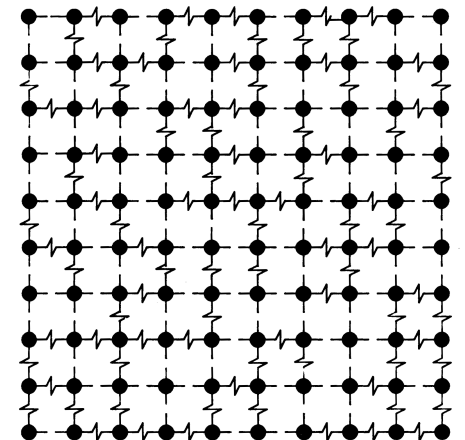
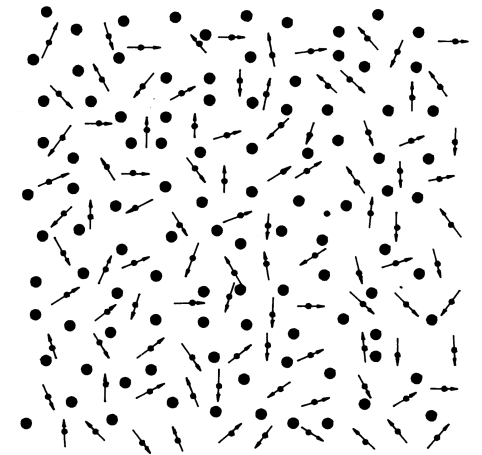
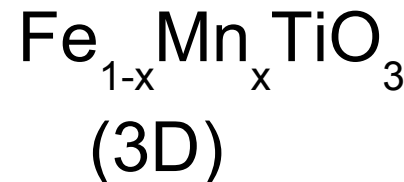
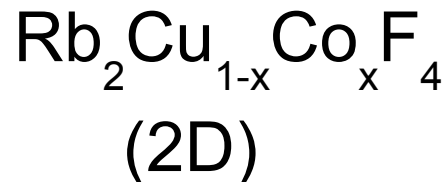
take non-magnetic metal (Au, Cu, Pt ...)

+ elements with magnetic moment (Mn, Fe, Gd, Eu, ...)

archetypes are  
noble metal alloys:  
(also called:  
canonical SG)



random site SG  
random bond SG





RSB picture for  
finite dimensions  
short range interactions

- (a) there are  $\infty$  many pure states  
with varying overlaps
  - (b) predictions derived from (a)
- 

droplet picture (for  
finite dimensions  
short range interactions)

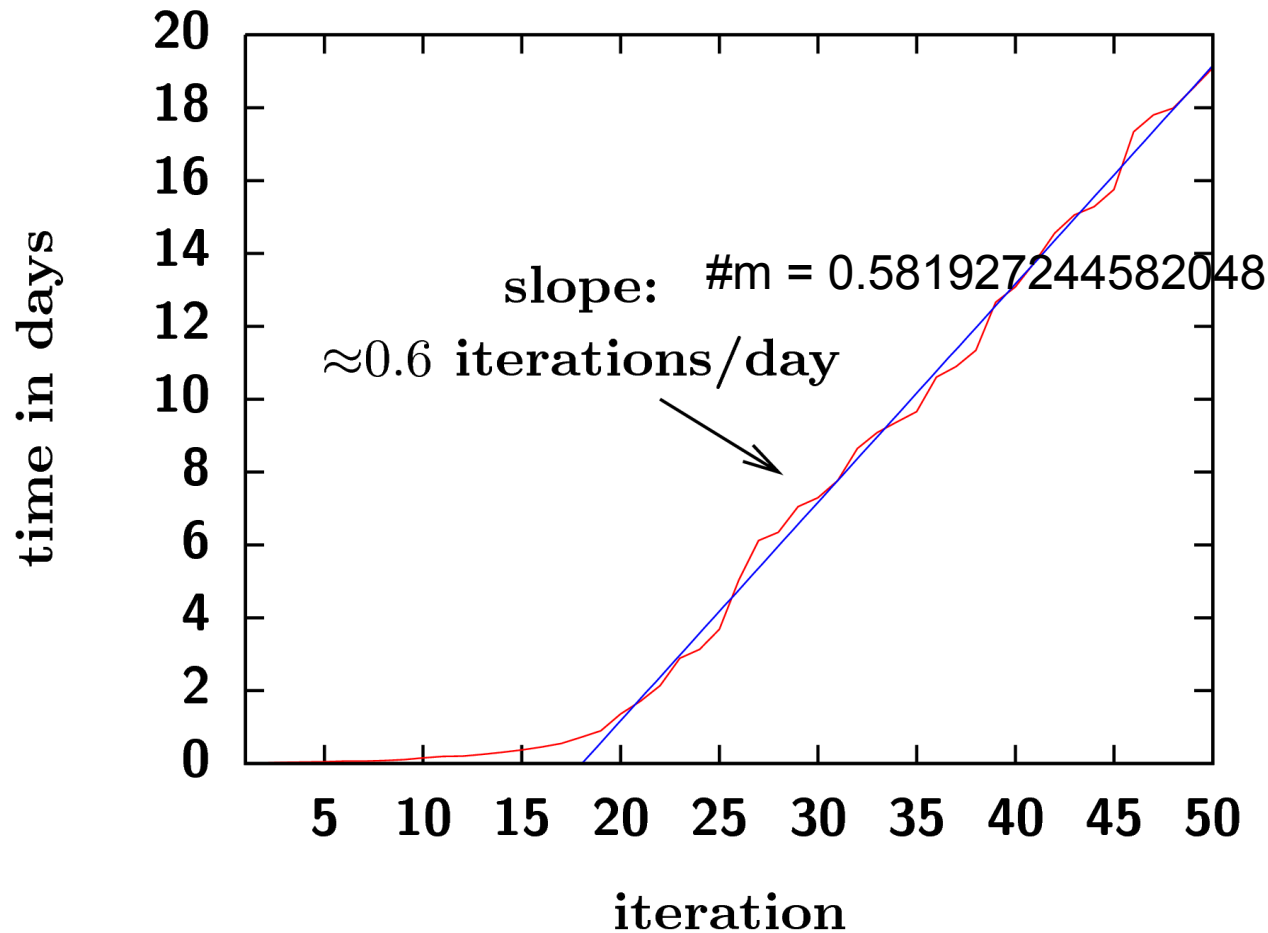
- (a) there are 2 pure states  
mapped to each other (like ferromagnet)
- (b) scaling of free energy of droplet
- (c) predictions derived from (a) and (b)

# Detour (or cul-de-sac): e.g.: Wang-Landau

Update rule for state  $X_1$  to  $X_2$ :  $p(X_1 \rightarrow X_2) = \min \left[ \frac{g(X_1)}{g(X_2)} \right]$

$g(X_{1,2}) = \text{frequency}(X_{1,2}) \times f(\text{iteration})$   
 gets somehow smaller

result of an (unbiased) 5x5x5 EAI SG:



criterion (e.g.):

$$\frac{h(\min)}{h(\max)} \approx c = 0.8$$

gets worse for larger system!