

Göttingen 12.10.05

# Quantum annealing and the random field Ising model

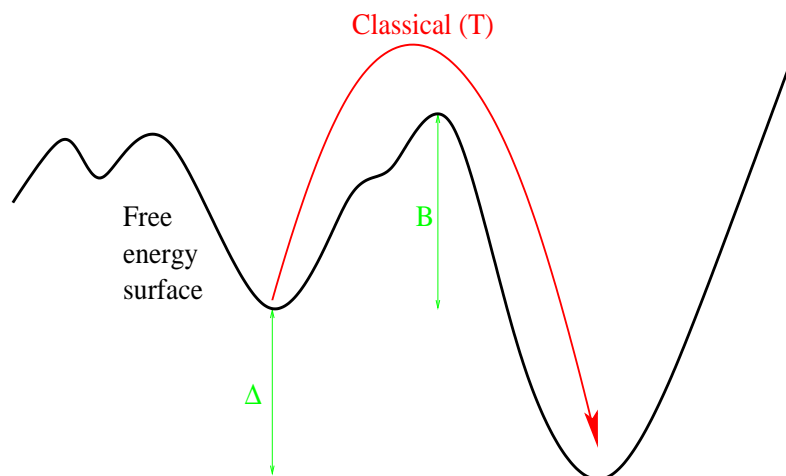
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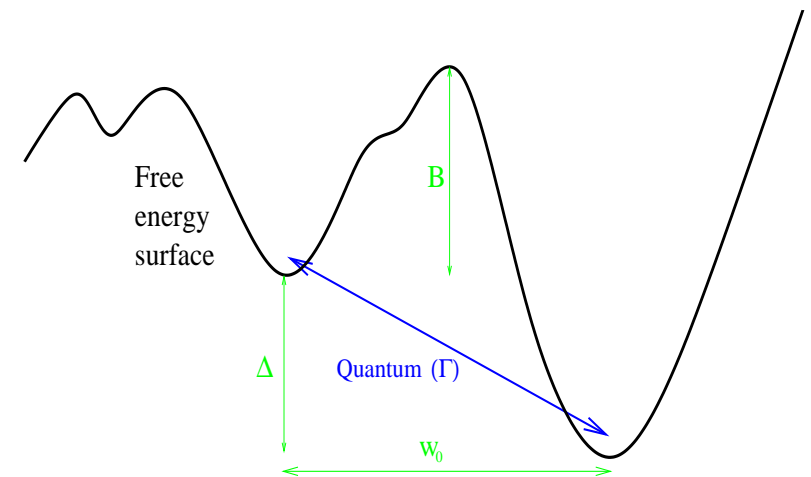
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Matti Sarjala, Vilho Petäjä (HUT)

# Quantum and classical annealing

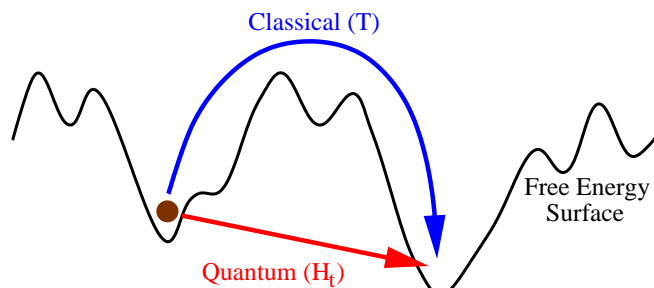


Classical energy landscape: use e.g. Simulated Annealing (lower the temperature).

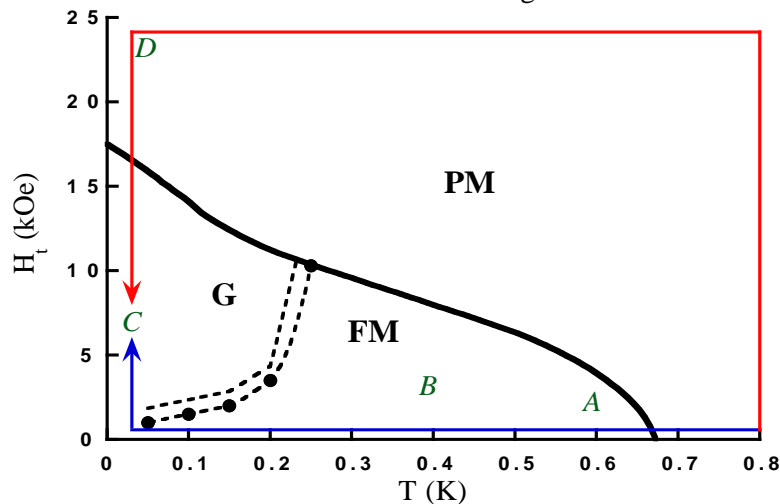


Quantum version: modify a quantum parameter.

# On Quantum Annealing



$\text{LiHo}_{0.44}\text{Y}_{0.56}\text{F}_4$   
Disordered Ferromagnet

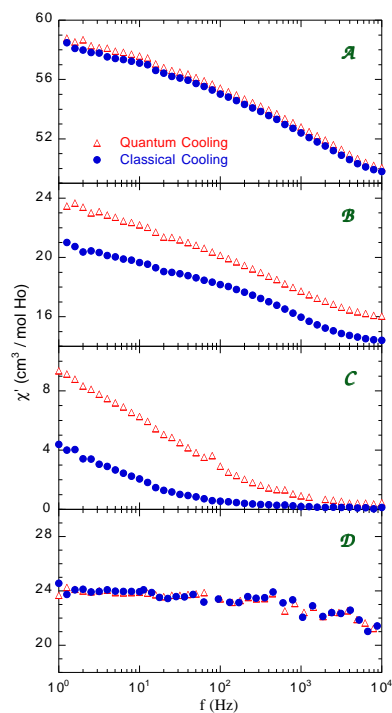


- Quantum annealing: system moves in the energy landscape by quantum tunneling.
- Small temperature, a finite quantum parameter  $\Gamma$ . Take  $\Gamma$  or  $\epsilon$  slowly towards zero ( $H = H_0 + \epsilon H_1$ ).
- QM picture: induced (Landau-Zener) level crossings, follow lowest energy state.

## Basic questions:

1. A quantum system  $\rightarrow$  a classical one ( $\Gamma = 0$ ).
2. “quantum computing” - see Brooke et al.  
Science/Nature.
3. how does this work vs. classical dynamics? In particular, if one wants to “optimize”.
4. this is what we study here!

# Experimental case-study



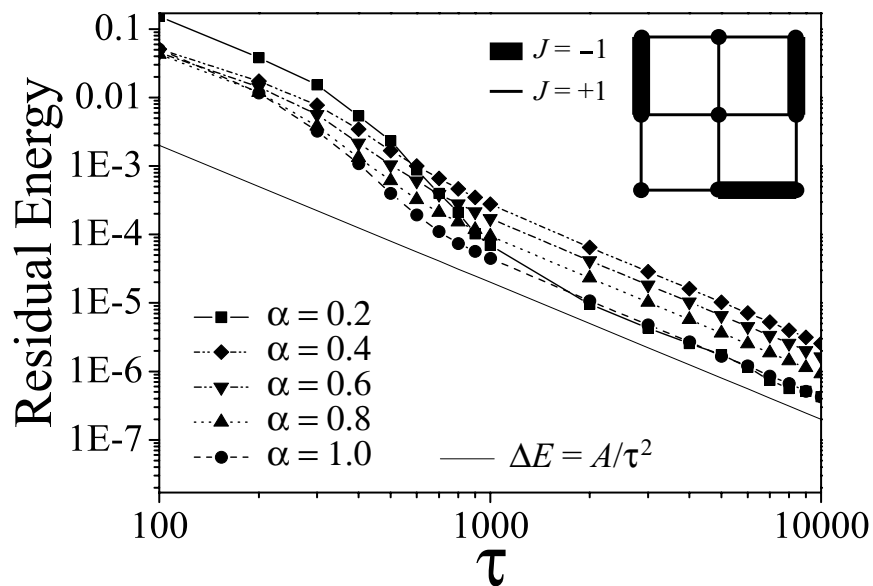
$$H = \sum_{ij} J_{ij} \sigma_i^z \sigma_j^z - \sum_i \Gamma \sigma_i^x$$

$\sigma$  Pauli spin matrices.

*LiHoF<sub>4</sub>*:

tetragonal insulating FM.

# Simple disordered Ising



(From cond-mat/0502....)

Residual energy:

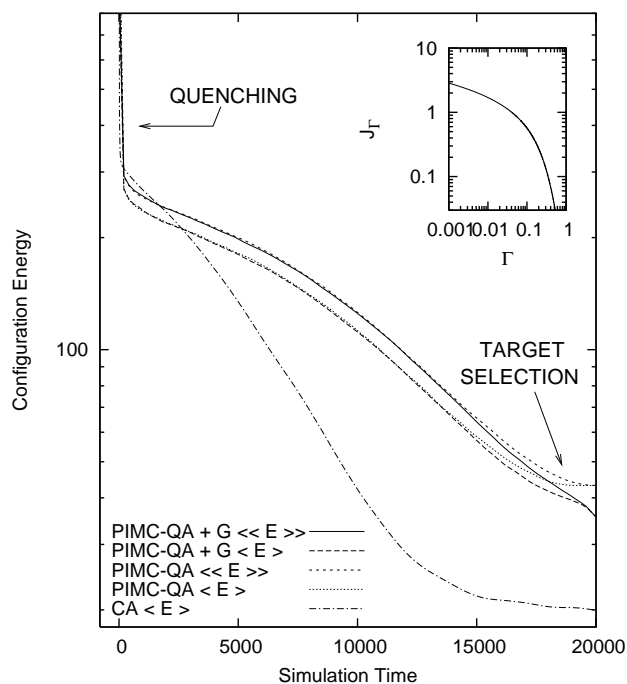
$$\epsilon_{res} = (E_s - E_{gs})/N,$$

actual vs. **groundstate**  
energy.

We want to optimize!

Here,  $\epsilon_{res}$  polynomial?

# Satisfiability problem(s)

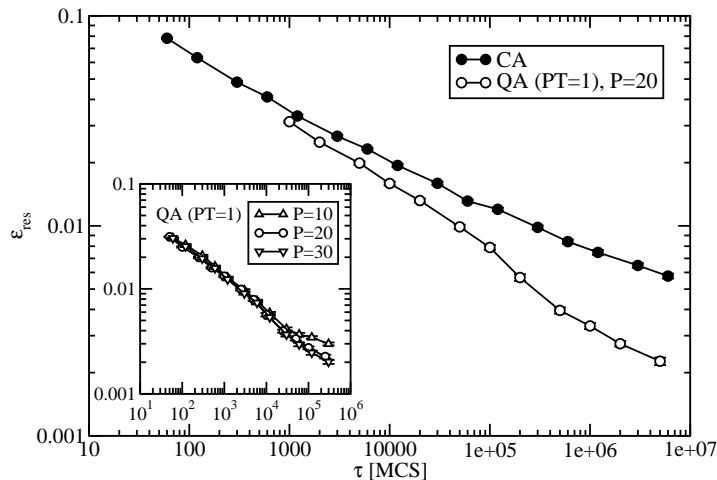


Santoro et al., cond-mat....

Apply quantum annealing to a NP-complete, K-SAT(isfiability) problem.

But: **C**lassical **A**nnealing better.

# QA and a spin glass



Santoro et al. (Science 2002).

QA faster than CA

(simulated annealing).

Scaling theory:  $\epsilon_{res} \sim \log N_{MC}^{-\zeta}$ .

For QA:  $2 \leq \zeta \leq 6$ ,

based on a Landau-Zener picture.



## Random field Ising model

The Hamiltonian :  $H = -J \sum_{\langle i,j \rangle} \sigma_i^z \sigma_j^z - \sum_i h_i \sigma_i^z$

$h_i$  are the random fields at site  $i$ , a (Gaussian) probability distribution  $P(h_i)$  w/ standard deviation  $\delta_h$ .

The GS computed via the mapping to the max-flow/min-cut problem.

## Why the RFIM?

- It is exactly solvable (and easily).
- It has a non-trivial energy landscape.
- RFIM: paramagnetic in 1D, 2D, phase transition in 3D. Overlap of GS with thermal state non-zero ( $q$ ),
- Poorly known when quantum annealing is superior to classical. No real theory.

# RFIM & QM

- QM effects can be tuned by varying a transverse field  $\Gamma$ .

The Hamiltonian reads:

$$\mathcal{H} = J \sum_{\langle ij \rangle} \sigma_i^z \sigma_j^z - \sum_i h_i \sigma_i^z - \Gamma \sum_i \sigma_i^x,$$

$\Gamma \sum_i \sigma_i^x$  stands for the quantum effects.

- QA: decrease  $\Gamma$  from an initial value towards zero.  
 $\Gamma(t)$ ? Usually, we use a logarithmical cooling schedule.
- $T > 0$ : a  $d$ -dimensional quantum lattice Hamiltonian maps to a  $d + 1$ -dimensional classical (Suzuki-Trotter).

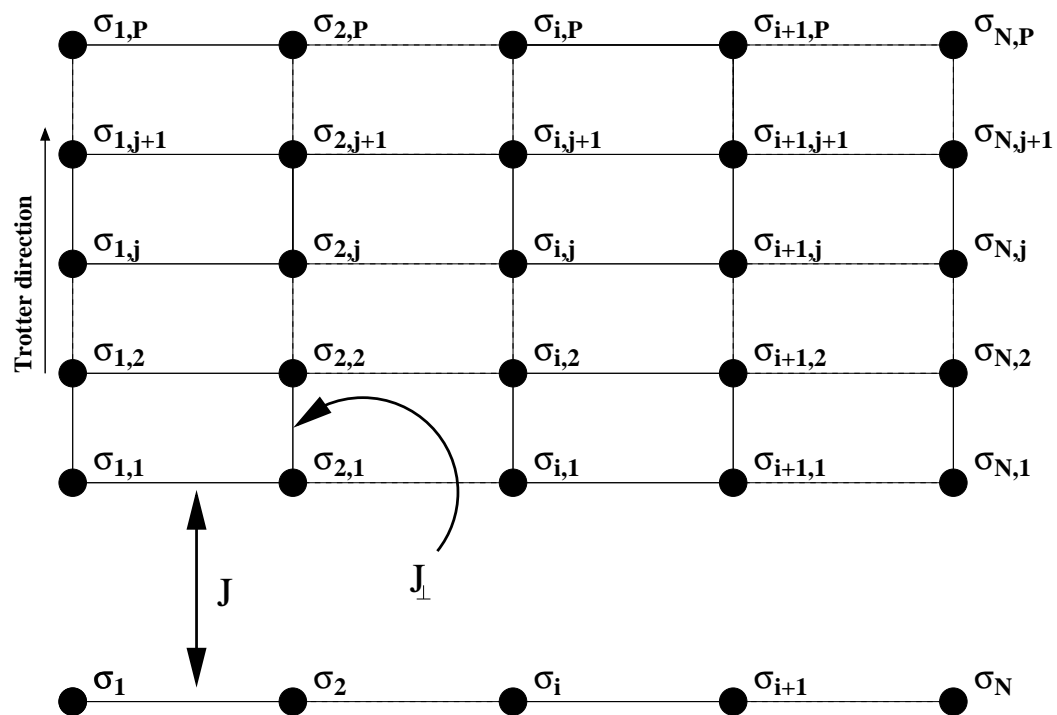
## Suzuki-Trotter

$$\mathcal{H}_{eff} = - \sum_{k=1}^P \left( J \sum_{\langle ij \rangle} \sigma_i^k \sigma_j^k - \sum_i h_i \sigma_i^k + J_{\perp} \sum_i \sigma_i^k \sigma_i^{k+1} \right)$$

$P$  is the number of Trotter slices,  $J_{\perp} = -\frac{T_{eff}}{2} \ln(\tanh \frac{\Gamma}{T_{eff}})$  is the coupling between the spins in Trotter direction.

$H_{eff}$  simulated at the effective temperature  $T_{eff} = PT$ .

# Suzuki-Trotter II



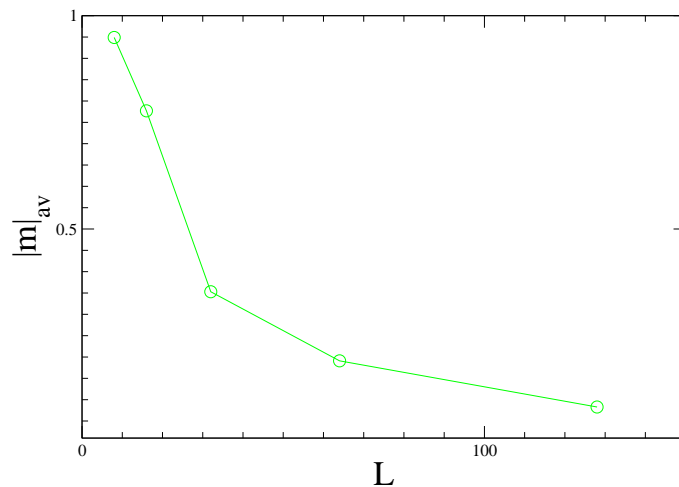
An example of the mapping.

## Typical run (1D)



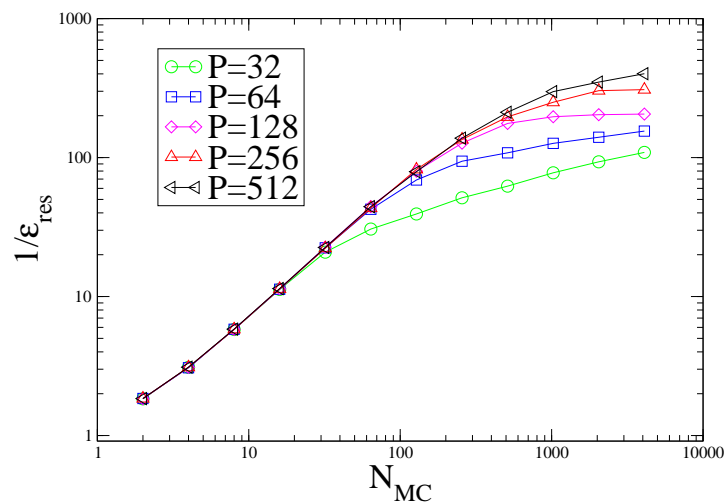
Spin orientations vs. GS at 3 times

## More details (1D)



An example of the decay of the magnetization. Recall: 1D paramagnetic.

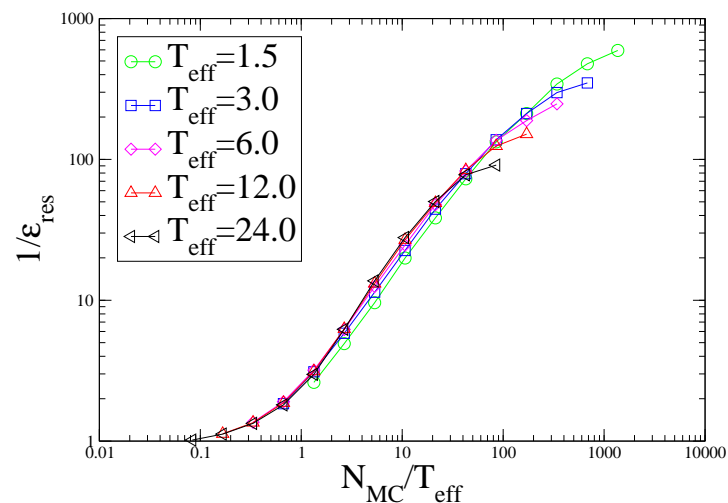
# Adding slices



More slices: better optimization. Recall that the **size** of the system becomes  $P$ -fold.



# Effective temperature



Again, a smaller  $T_{eff}$  results in a better  $\epsilon_{res}$  but more slowly.

## Paramagnetic phase

- Huse and Fisher [Phys. Rev. Lett. **57**, 2205 (1986)]: arbitrary two-level systems in the case of simulated annealing, with an energy barrier between the states.

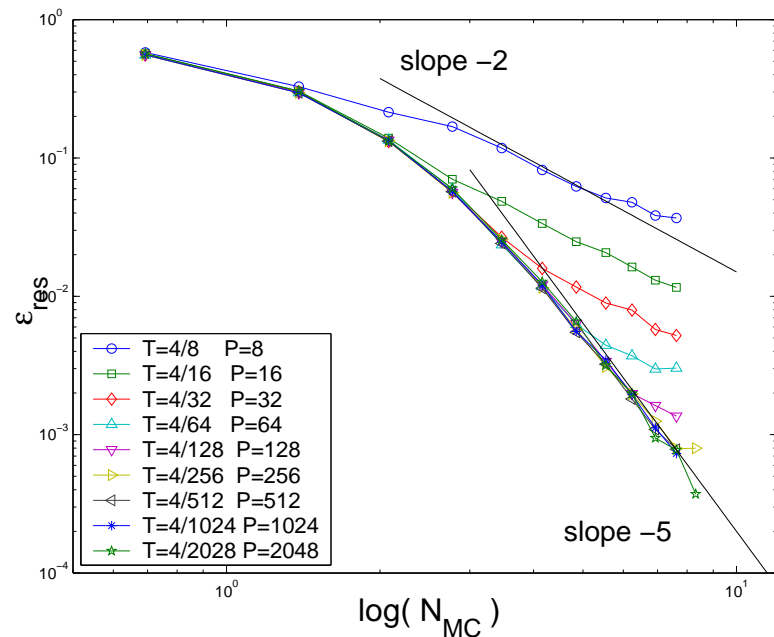
Their result:

$$\epsilon_{res} \sim \log(N_{MC})^{-\zeta}$$

where  $\zeta = 2$ .

- Santoro *et al.* [Science **295**, 2427 (2002)] again: 2D SG ( $T = 0$ -phase transition).  $\zeta > 2$ ?

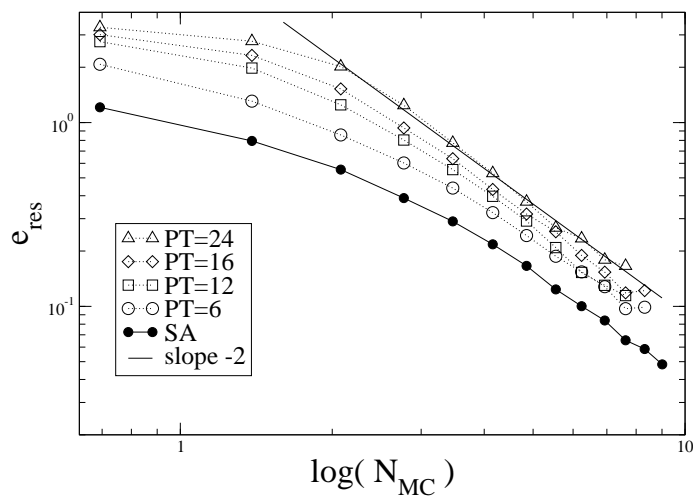
# General picture (1D)



What a surprise: more slices ( $P$ ) and a smaller temperature work!

- The essential behavior in the paramagnetic phase.
- Idea: use quantum fluctuations ( $P \sim \sqrt{N_{MC}}$ ).
- “things go wrong” - SA result recovered  $\zeta = 2$ .
- Things go well:  $\zeta \rightarrow 6?$ .

## 2D case



In 2D, the RFIM “pseudo-FM” for  $L$  small.

Thus, a cross-over expected.

## 3D considerations

- Now, a phase transition ( $T(\delta h)$ ) - PM/FM.

- Huse and Fisher: in FM phase

$$\epsilon_{res} \sim \log(N_{MC})^{-\zeta}$$

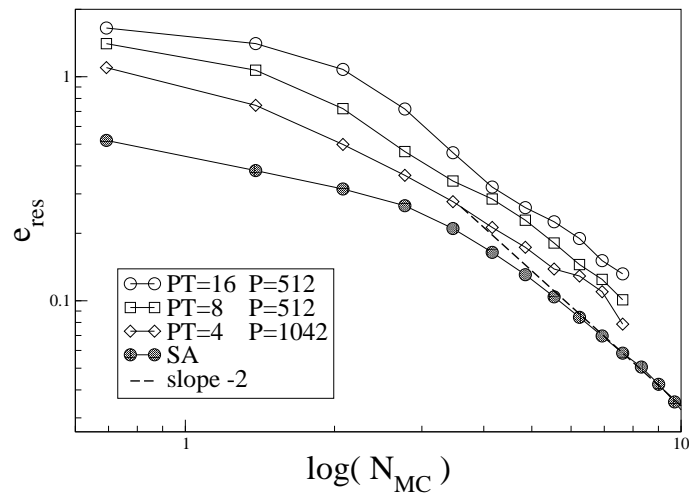
with  $\zeta = 1$ .

- Nash *et al.* [Phys. Rev. B **43**, 1272 (1991)]: activated scaling behavior observed, with  $\zeta = 1.05 \pm 0.16$ .

## FM phase & Quantum annealing

- Also, a phase transition in 3D at some quantum parameter strength  $\Gamma_c$ .
- Using the energy barrier argument: the residual energy decreases as in classical case, but possibly with different exponent  $\zeta_q$  [Phys. Rev. B **57**, 8375 (1998)].

## 3D data



Note the parameters - and the SA result.

## Final thoughts

- Cooling schedule (in)dependence in PM phases.
- PM: QA better. FM: not so.
- Where is the theory,  $\zeta$ ?
- That is, no general knowledge how QA works for difficult problems (K-SAT, TSP etc.). Santoro...
- Use some kind of cluster algorithms?
- Bob Laughlin: “quantum computing is ...”