

Trapped ions as a quantum spin glass annealer

Tobias Grass
JQI
11.18.2016



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I.

Motivation:
computational
complexity

III.

Numerical
simulation of
annealing dynamics

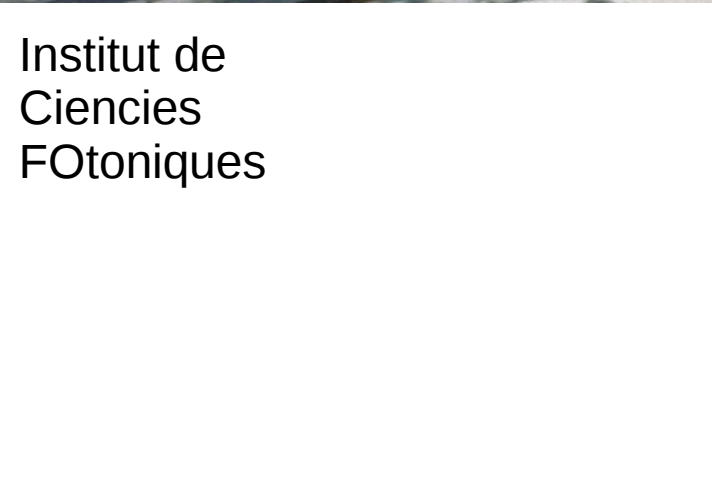
II.

Spin
models
from ion
chains

ICFO, Barcelona, Castelldefels



Castelldefels
beach



Institut de
Ciències
Fotòniques

Trapped ions as a quantum spin glass annealer

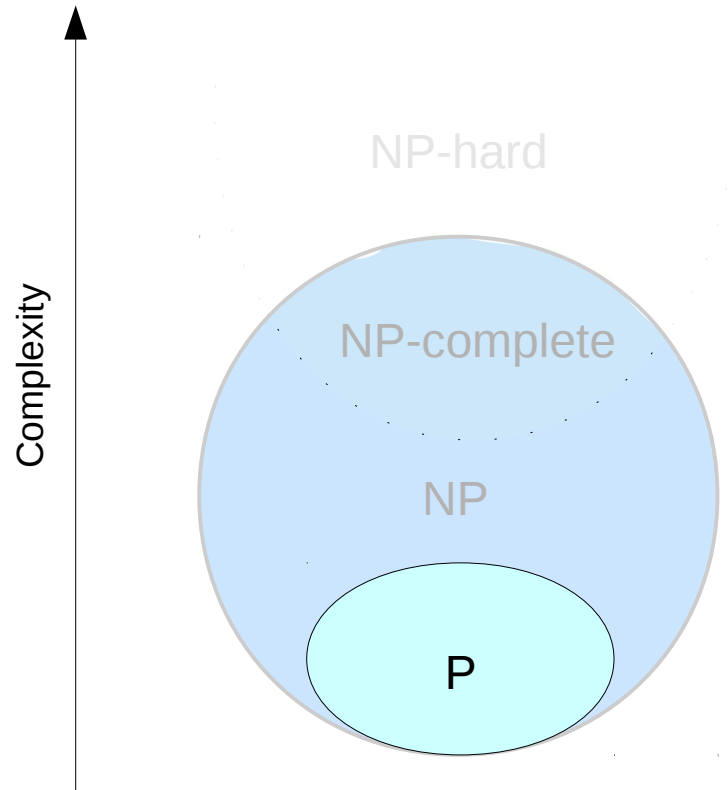
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I.

Motivation:
computational
complexity

The background of the slide is a photograph of three slices of pepperoni pizza arranged on a white paper tray. The pizza slices are triangular and topped with melted cheese and several slices of pepperoni. The tray is set against a light-colored background, possibly a table or counter.

Motivation: Complexity classes



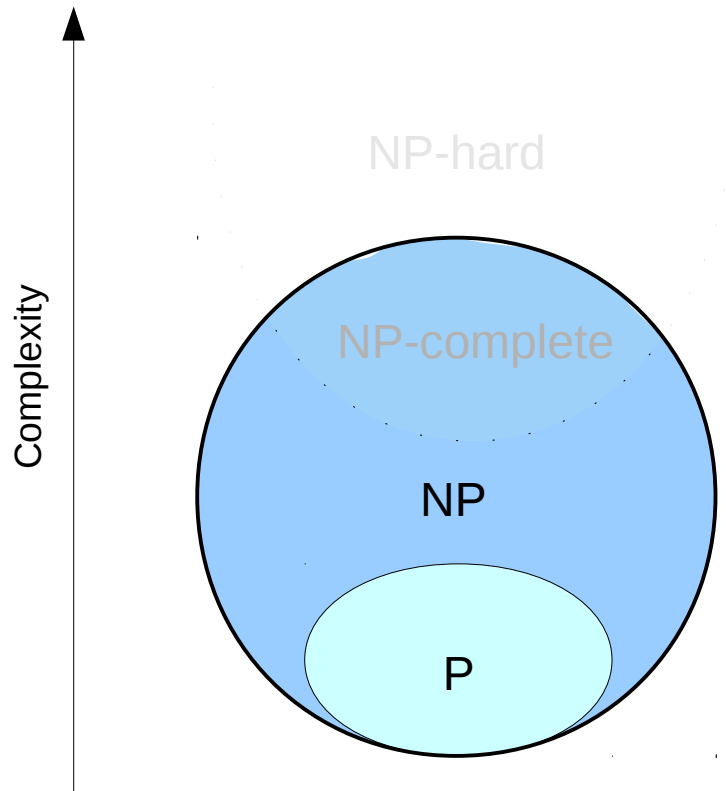
NP-hard: Problems at least as hard as NP-complete problems, but not necessarily in NP

NP-complete: “Hardest” problems in NP (to which any NP problem can be mapped in polynomial time)

NP: Decision problems which can be *solved* on a **non-deterministic** computer (or whose positive answer can be *verified* on a deterministic computer) in polynomial time

P: Decision problems solvable on a deterministic computer in polynomial time

Motivation: Complexity classes



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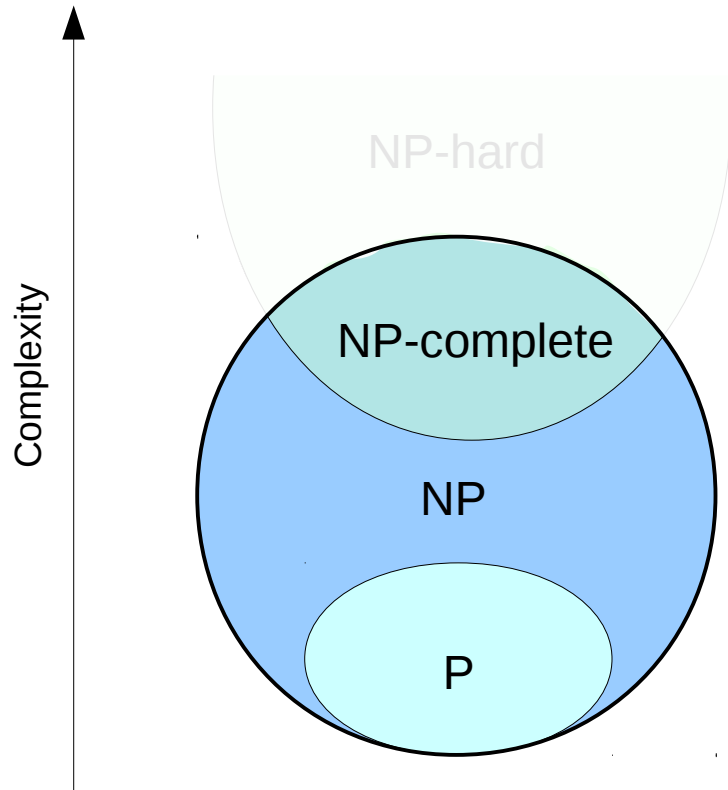
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P: Decision problems solvable on a deterministic computer in polynomial time

$P = NP ?$



Motivation: Complexity classes



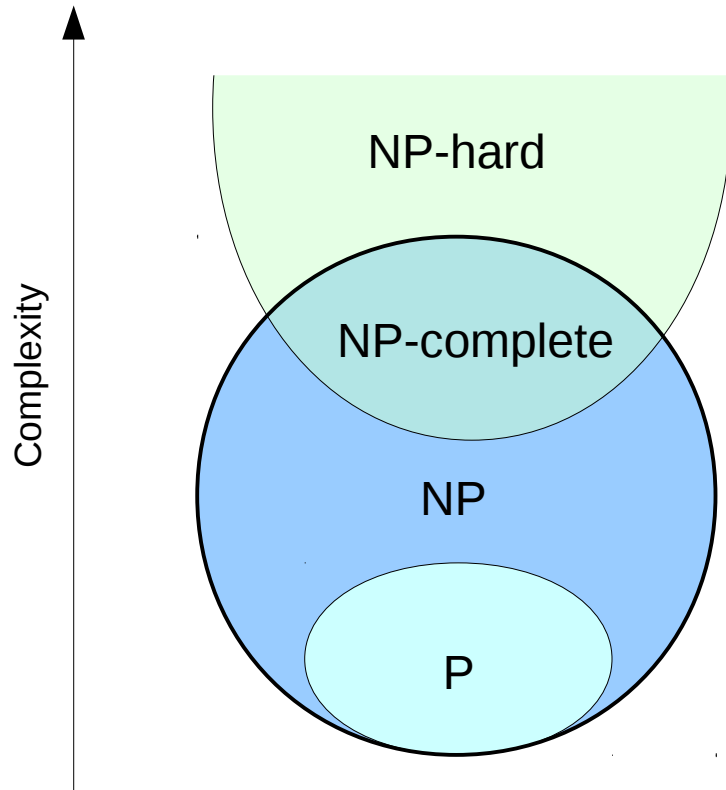
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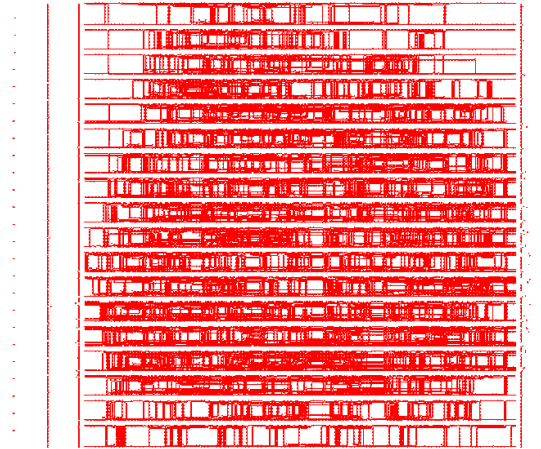
P: Decision problems solvable on a deterministic computer in polynomial time

NP-complete problems

Traveling salesman problem

World record:

85,900 connections on a computer chip
computation time: 136 CPU yrs.



2 6 7 9 12 13 17 20

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2+9+12+20 -6 -7-13 -17 = 0

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Spin glasses

Spin models with random couplings

Number partitioning

PHYSICAL REVIEW
LETTERS

VOLUME 81

16 NOVEMBER 1998

NUMBER 20

Phase Transition in the Number Partitioning Problem

Stephan Mertens*

Universität Magdeburg, Institut für Physik, Universitätsplatz 2, D-39106 Magdeburg, Germany
(Received 6 July 1998)

Journal of Physics A: Mathematical and General

[Journal of Physics A: Mathematical and General](#) > [Volume 15](#) > [Number 10](#)

On the computational complexity of Ising spin glass models

F Barahona

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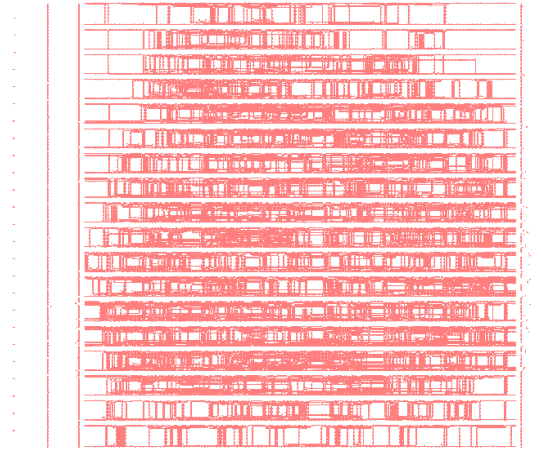
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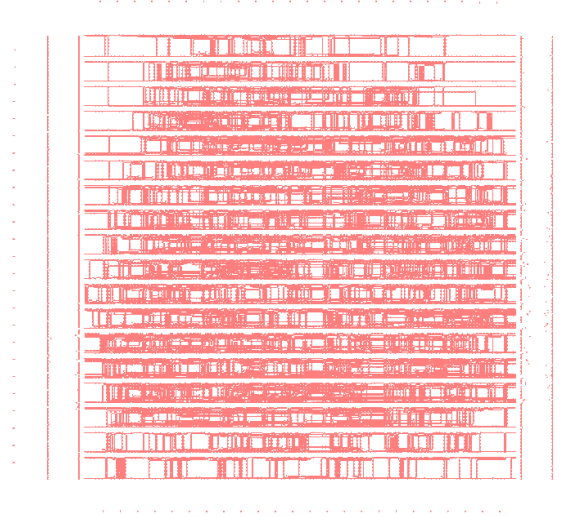
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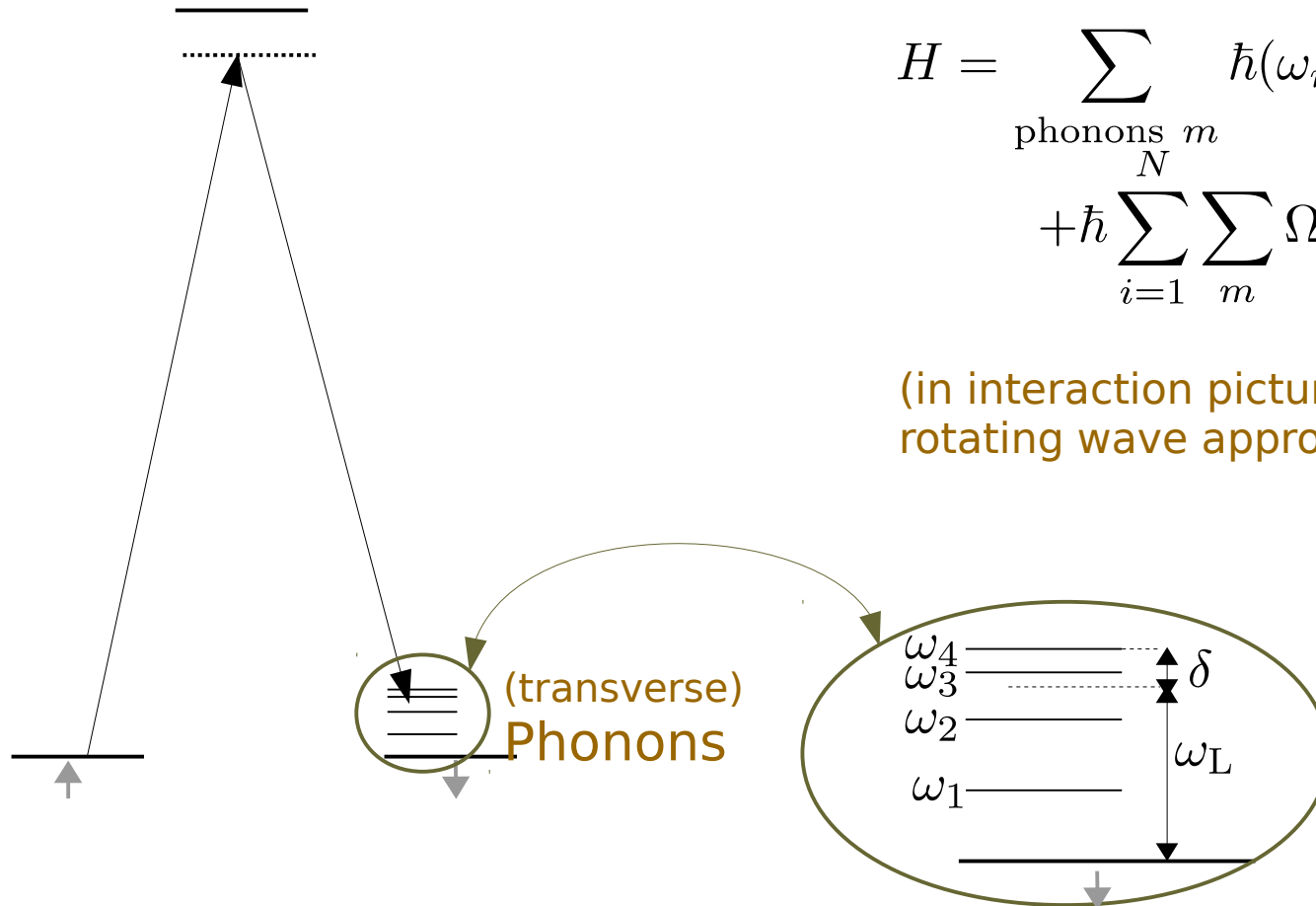
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The image shows three slices of pepperoni pizza arranged on a white paper tray. The pizza has a golden-brown crust and is topped with melted cheese and several slices of pepperoni. The text is overlaid on the central slice.

**II.
Spin
models
from ion
chains**

Trapped ions spin models

Spin-phonon coupling



$$H = \sum_{\text{phonons } m} \hbar(\omega_m - \omega_L) \hat{a}_m^\dagger \hat{a}_m + \hbar \sum_{i=1}^N \sum_m \Omega^{(i)} \eta_m^{(i)} (\hat{a}_m + \text{H.c.}) \sigma_x^{(i)}$$

(in interaction picture after rotating wave approximation)

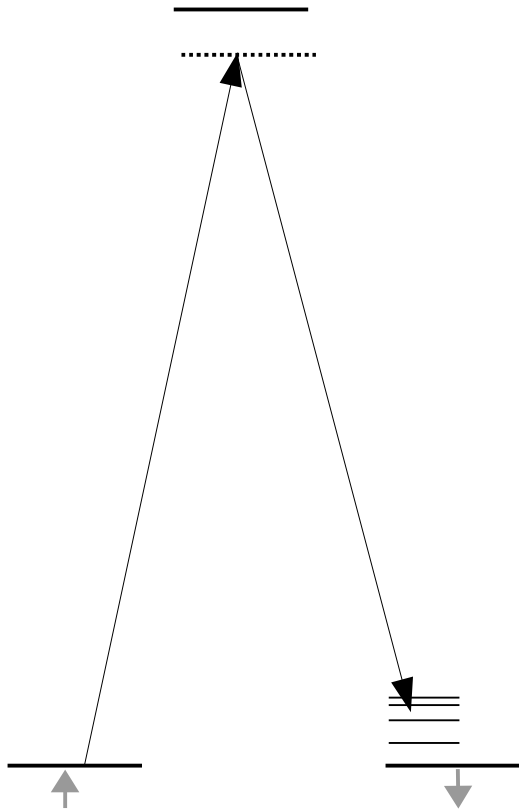
$\Omega^{(i)}$: Rabi frequency (at ion i)

$\eta_m^{(i)}$: Lamb-Dicke parameter (ion i to mode m)

ω_L : laser beatnote frequency

Trapped ions spin models

Spin-phonon coupling



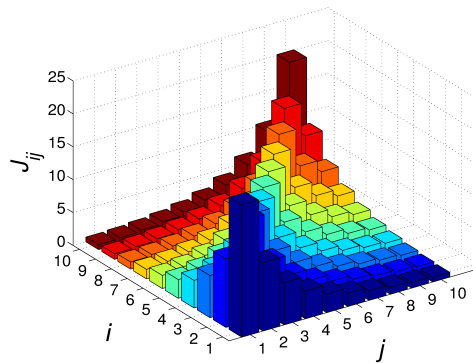
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 ω_L : laser beatnote frequency

Effective Hamiltonian:

$$H_{\text{eff}} = - \sum_{ij} \sum_m \frac{\hbar \Omega_i \Omega_j \eta_m^{(i)} \eta_m^{(j)}}{\omega_m - \omega_L} \sigma_x^{(i)} \sigma_x^{(j)} = - \sum_{ij} J_{ij} \sigma_x^{(i)} \sigma_x^{(j)}$$

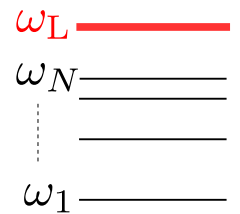
Ising-like model with controllable long-range coupling:

(a)

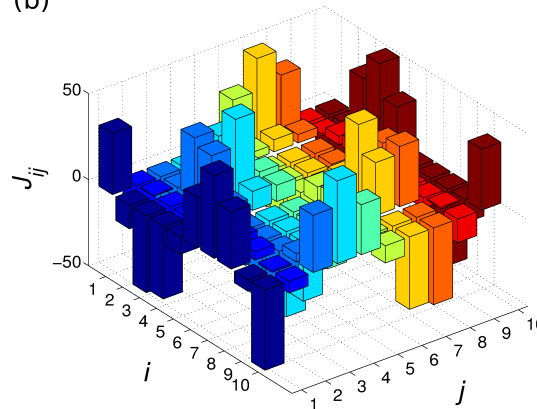


$\omega_L > \omega_N$:

- antiferromagnetic
- power-law decay

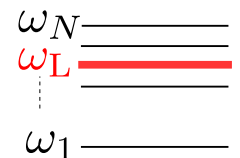


(b)



$\omega_1 < \omega_L < \omega_N$:

- mixed signs
- glassy



Near resonance: Mattis model

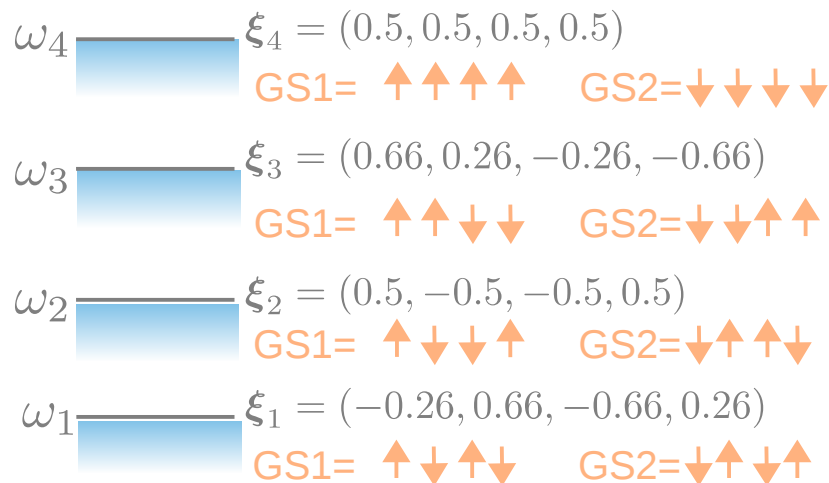
At l -th phonon resonance: $J_{ij} \propto \sum_m \frac{\xi_m^{(i)} \xi_m^{(j)}}{\omega_m - \omega_L} \Rightarrow J_{ij} \propto \pm \xi_\ell^{(i)} \xi_\ell^{(j)}$

$$H_{\text{eff}} \propto \pm \sum_{ij} \xi_\ell^{(i)} \xi_\ell^{(j)} \sigma_x^{(i)} \sigma_x^{(j)} \quad \text{factorizes:} \quad H_{\text{eff}} \propto \pm \left(\sum_i \xi_\ell^{(i)} \sigma_x^{(i)} \right)^2$$

Minus: Ferromagnetic coupling

Two-fold degenerate ground state defined by the mode pattern:

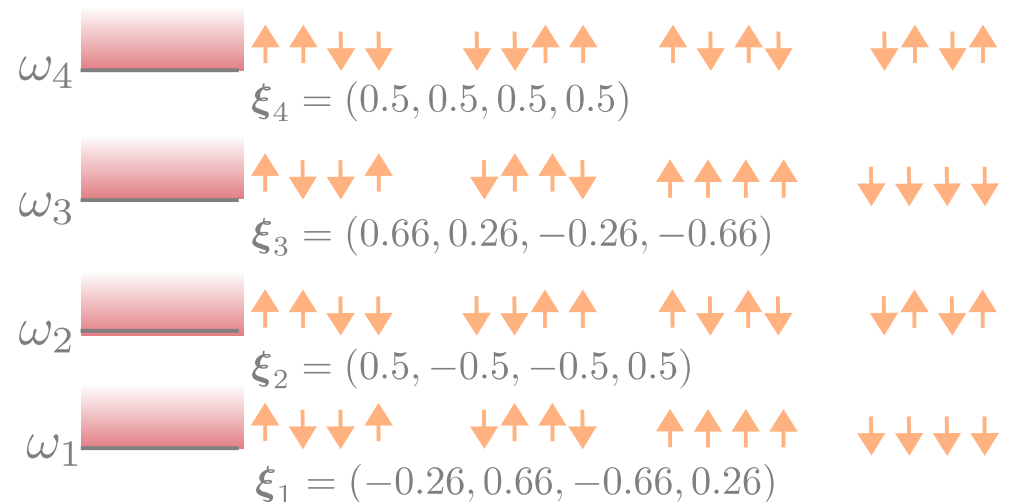
$$\langle \sigma_x^{(i)} \rangle = \pm \text{sign}(\xi_\ell^{(i)})$$



Plus: Antiferromagnetic coupling

Energy is cost function of *number partitioning problem*:

$$E = \left(\sum_{i \in \uparrow} \xi_\ell^{(i)} - \sum_{i \in \downarrow} \xi_\ell^{(i)} \right)^2$$



Near resonance: Mattis model

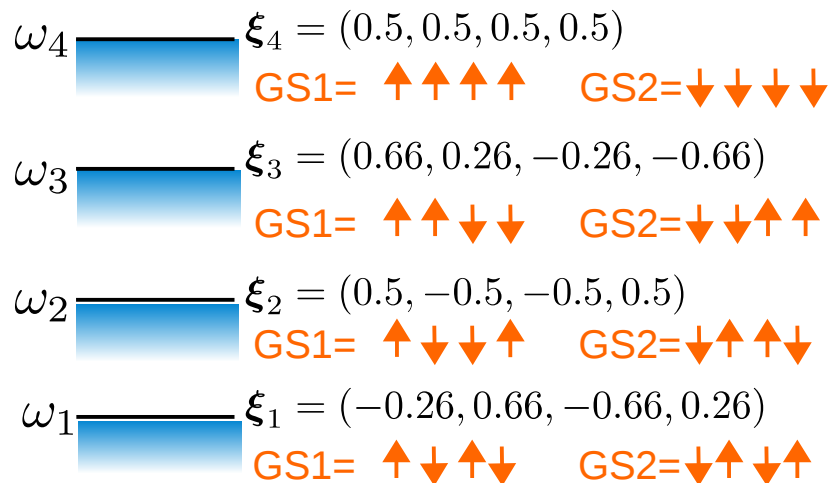
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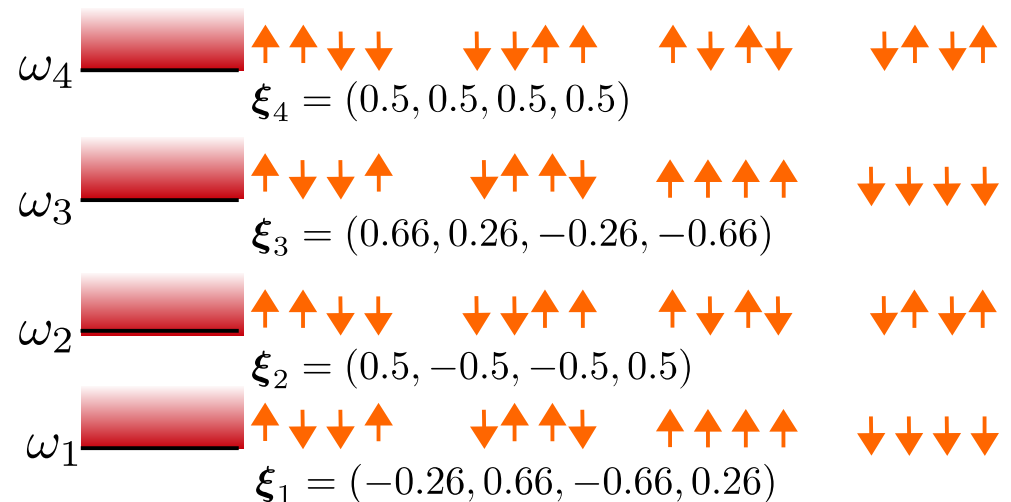
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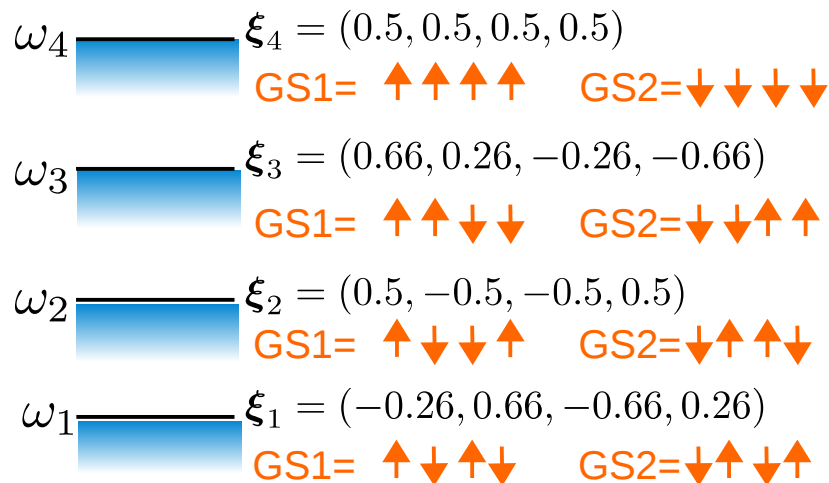
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Minus: Ferromagnetic coupling

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Plus: Antiferromagnetic coupling

Energy is cost function of *number partitioning problem*:

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$2^{N/2}$ ground states due to parity symmetry

- Number partitioning is trivial.
- Problem becomes hard if degeneracy is lifted.
- Off-resonant modes select unique ground state.

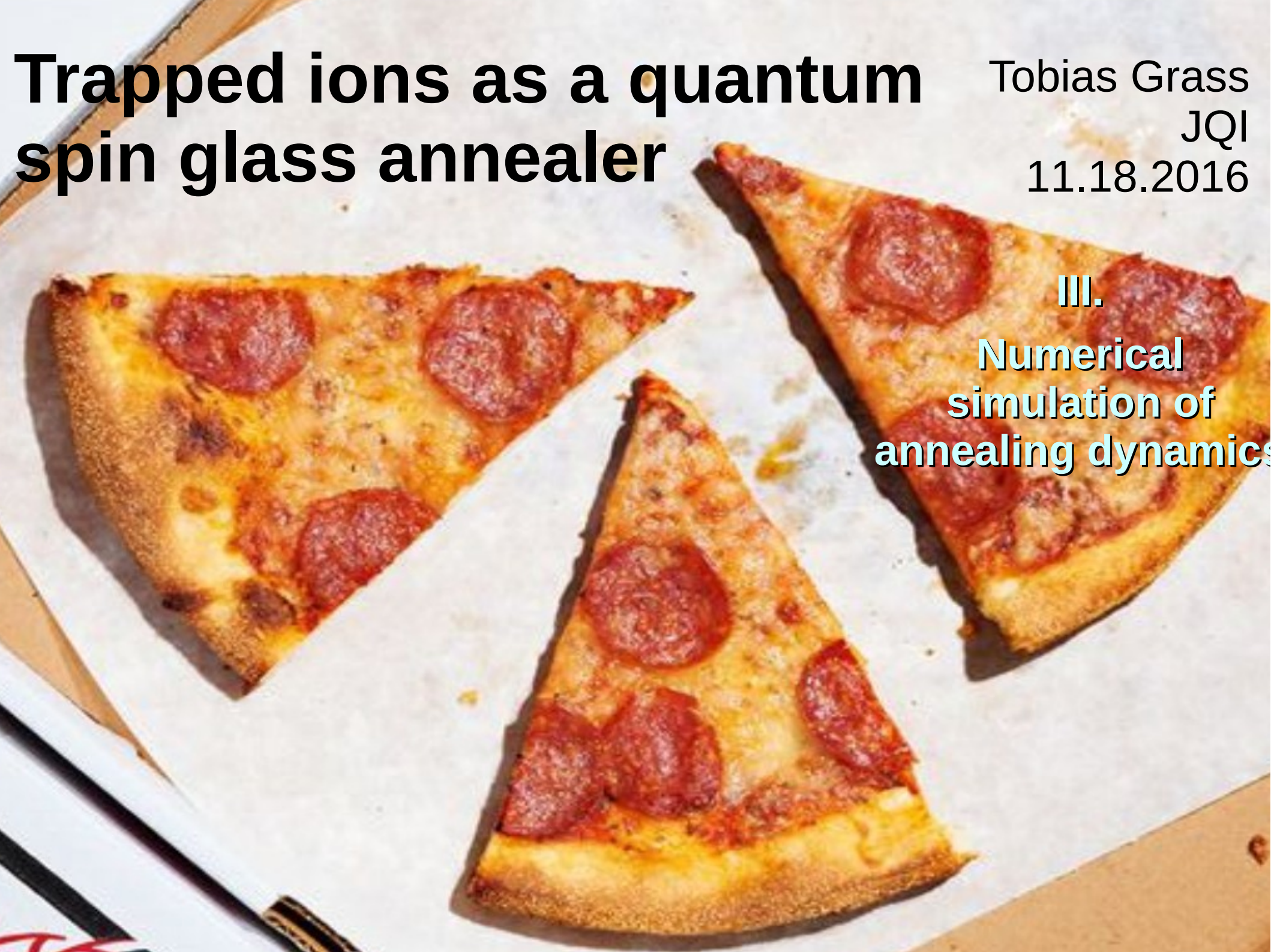
Solution via quantum annealing?

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III.

Numerical
simulation of
annealing dynamics



From classical to quantum

Classical Hamiltonian

$$H = - \sum_{ij} J_{ij} \sigma_x^{(i)} \sigma_x^{(j)}$$

Quantum Hamiltonian

$$H = - \sum_{ij} J_{ij} \sigma_x^{(i)} \sigma_x^{(j)} + B \sum_i \sigma_z^{(i)}$$

Quantum fluctuations due to transverse field

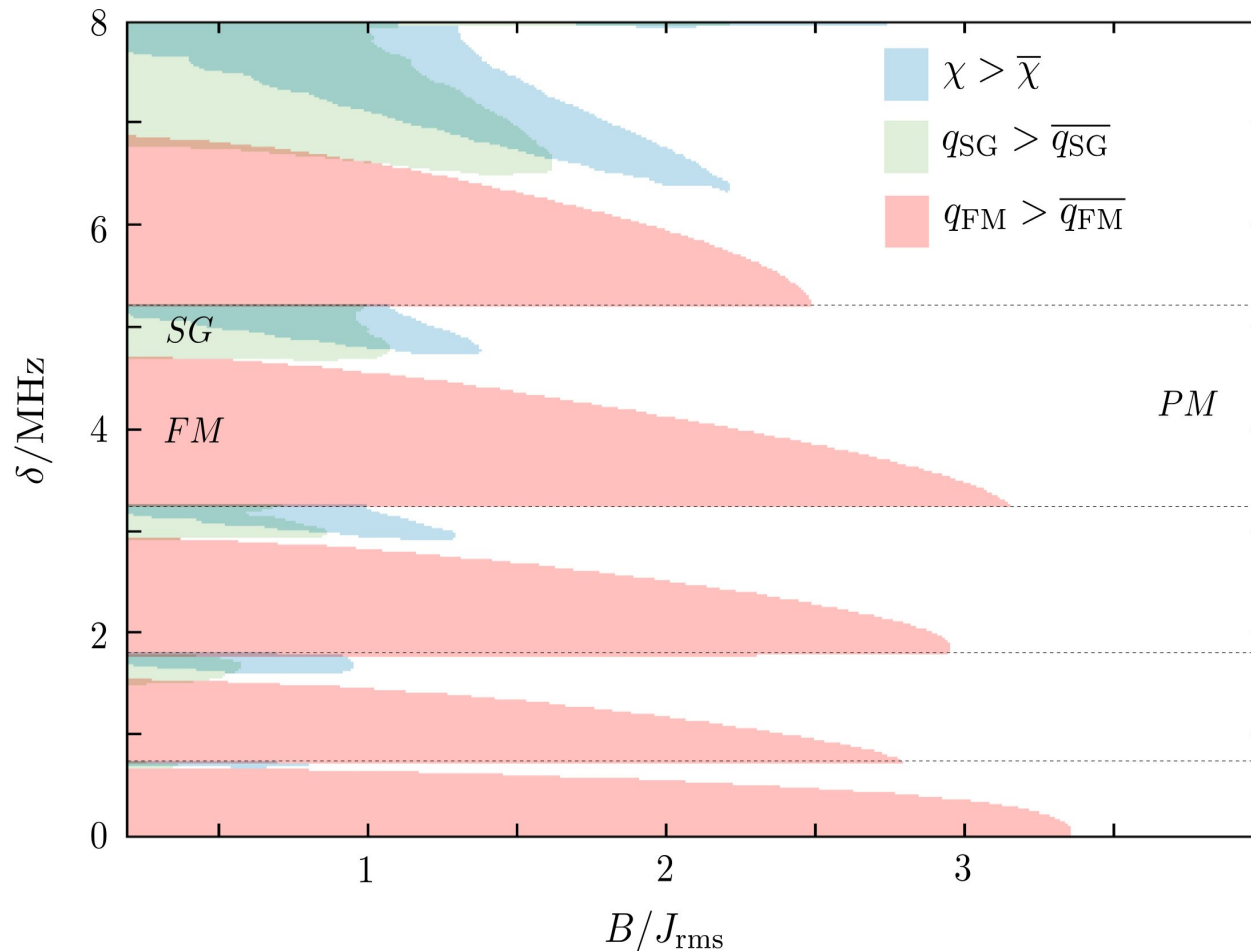
Spin glass
or
“ferromagnet”

Quantum spin glass
or “ferromagnet”
or paramagnet

Quantum annealing:
Dynamics in a slowly decaying
transverse field

“Phase diagram”

System properties upon varying detuning and transverse field for $N=6$:



Useful thermal averages:

$$q_{\text{FM}} = \frac{1}{N} \sum_i \langle \langle \sigma_x^i \rangle \rangle_T^2$$

$$q_{\text{EA}} = \frac{1}{N} \sum_i \langle \langle \sigma_x^i \rangle^2 \rangle_T$$

$$q_{\text{SG}} = q_{\text{EA}} / q_{\text{FM}}$$

(should be calculated for $k_B T \approx J$
in the presence of a Z_2 breaking field)

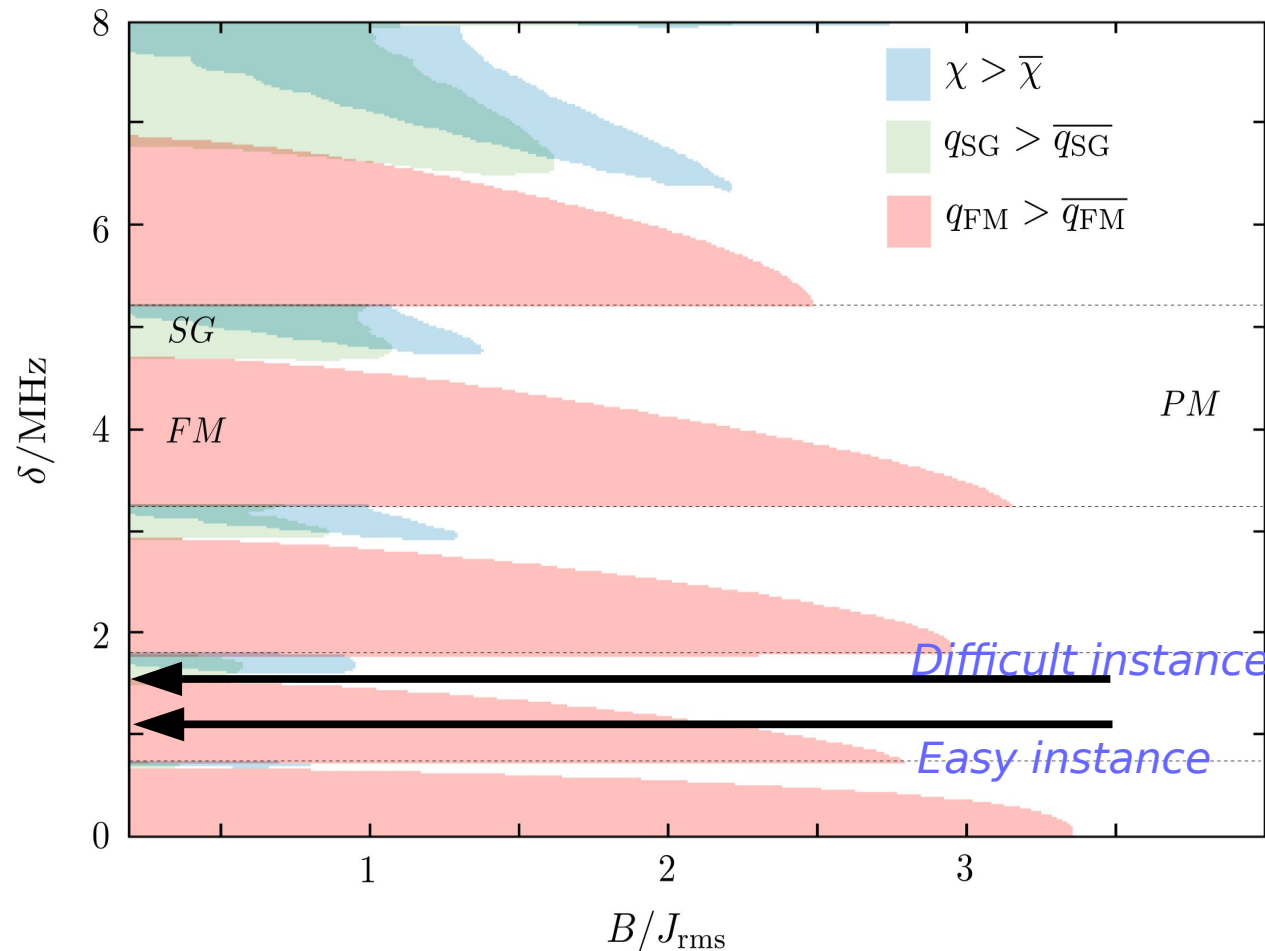
Magnetic susceptibility:

$$\chi = \frac{1}{N} \sum_{ij} \left(\frac{\partial \langle \sigma_x^i \rangle}{\partial h_x^j} \right)^2$$

(small longitudinal field h plus Z_2 breaking field)

Quantum annealing

System properties upon varying detuning and transverse field for $N=6$:



Using Krylov methods we simulate dynamics in a time-dependent Hamiltonian for 6 spins and including the phonons:

$$H(t) = H_0(t) + B(t) \sum_i \sigma_z^{(i)} + \epsilon_{\text{bias}} \sigma_x^{(1)}$$

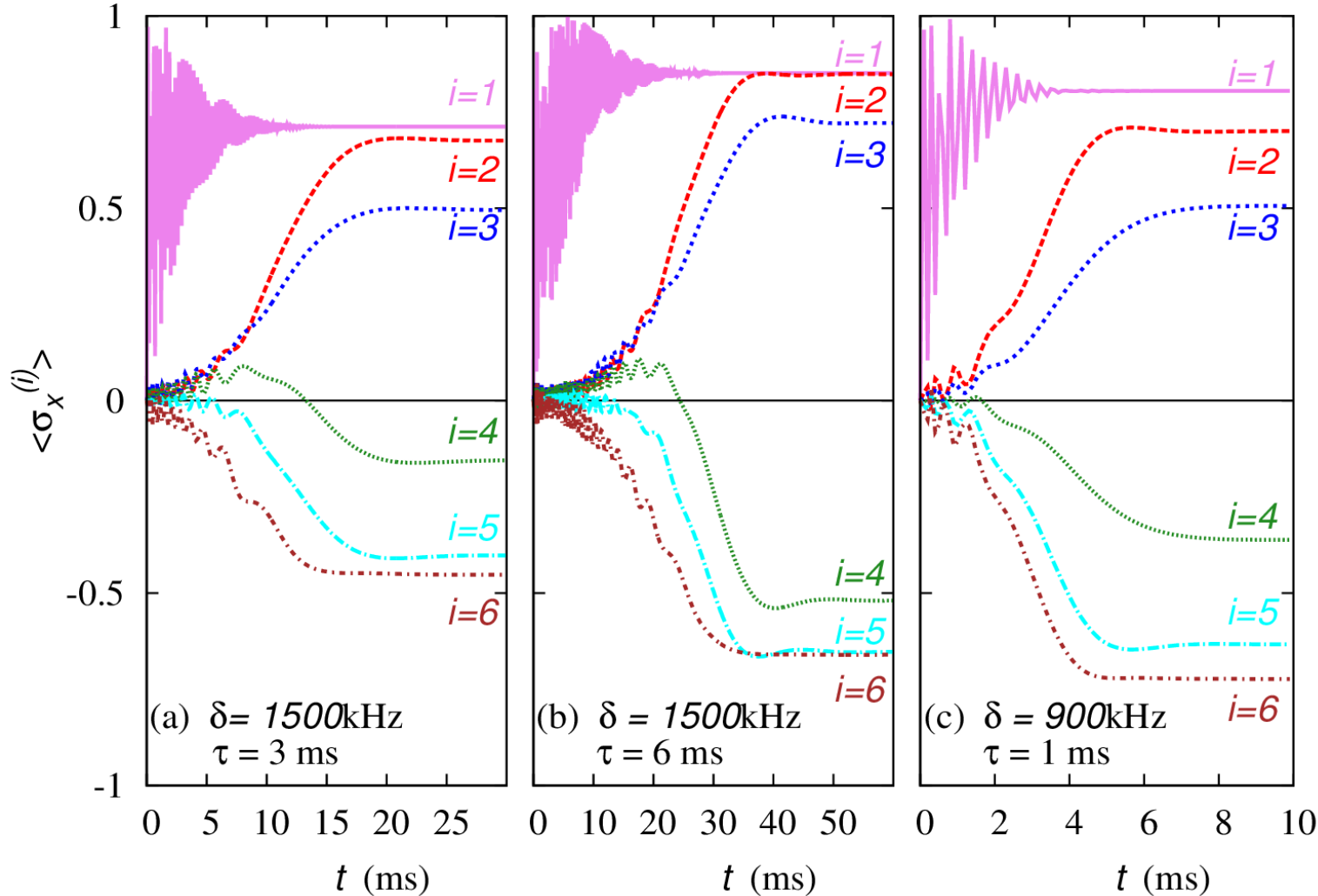
Spin-phonon coupling:

$$H_0(t) = \sum_m \hbar \omega_m a_m^\dagger a_m + \hbar \Omega \sin(\omega_L t) \times \sum_{i,m} \xi_m^{(i)} \sqrt{\frac{\omega_{\text{recoil}}}{\omega_m}} \sigma_x^{(i)} (a_m + a_m^\dagger)$$

Decaying transverse field:

$$B(t) = B_0 \exp(-t/\tau)$$

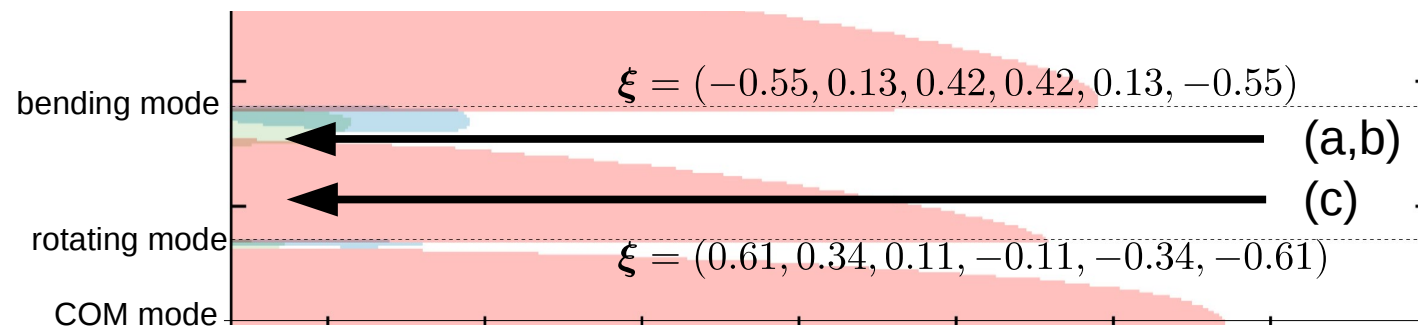
Exact dynamics (6 ions)



Local magnetization vs time:

(a,b) glassy target state
(c) ferromagnetic target state

For all instances, the correct sign (defined by pattern of the rotating mode) is produced during the annealing



Semiclassical approximation

Heisenberg equations
of motion:

$$i\hbar \frac{d}{dt} \langle a_m \rangle = \langle [a_m, H(t)] \rangle$$

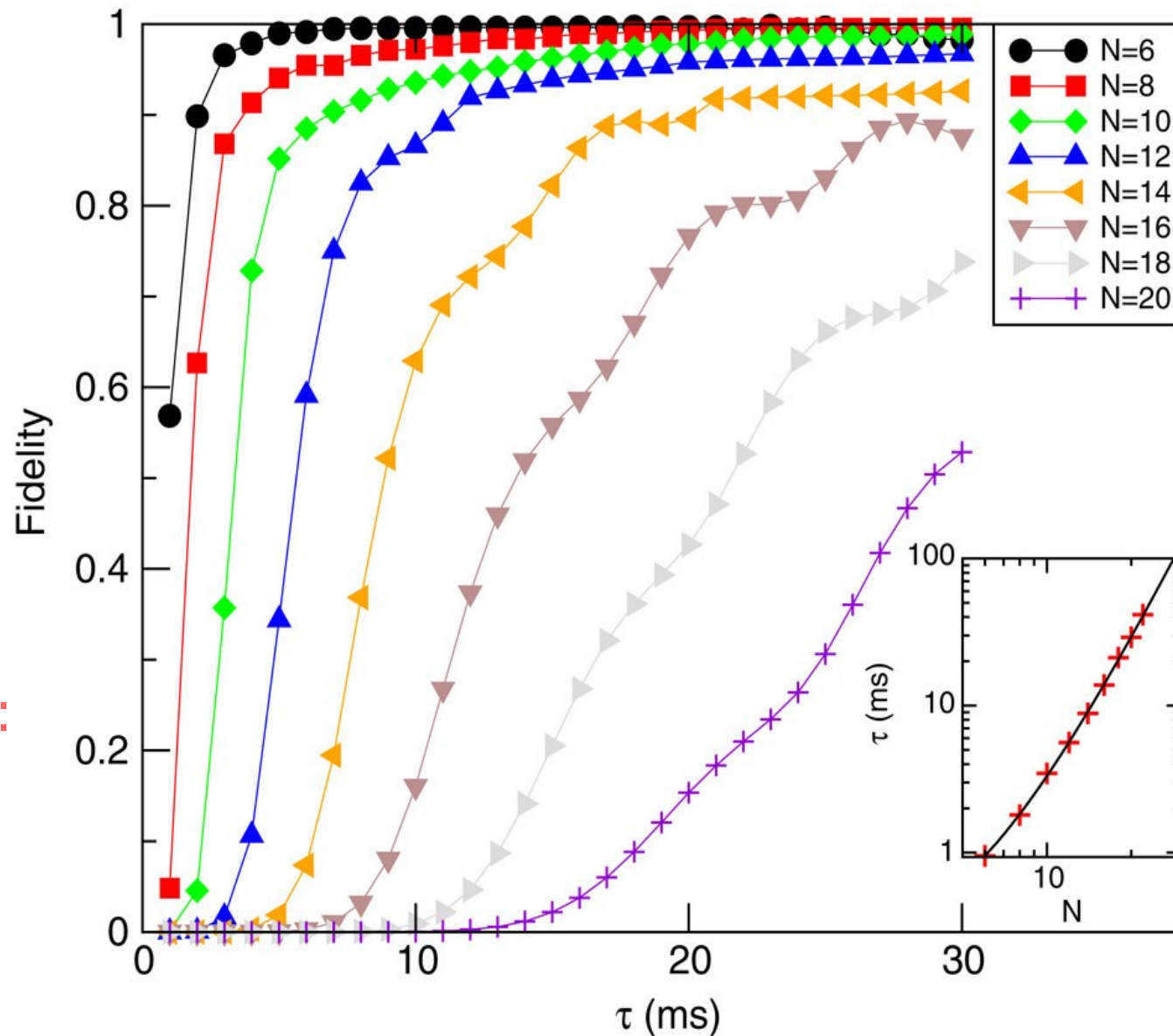
$$i\hbar \frac{d}{dt} \langle \sigma_\alpha^i \rangle = \langle [\sigma_\alpha^i, H(t)] \rangle$$

Mean-field decoupling:

$$\langle a_m \sigma_x^i \rangle \approx \langle a_m \rangle \langle \sigma_x^i \rangle$$

Scaling up to 22 ions:
Polynomial increase
of annealing time:

$$\tau \propto N^4$$



Summary

[T. Grass *et al.*, Nat. Commun. **7** 11524 (2016)]



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(ICFO)



Bruno Juliá-
Díaz (UB, ICFO)



Christian
Gogolin
(ICFO,MPQ)



Maciej
Lewenstein
(ICFO, ICREA)

- Ion chains can naturally incorporate spin glass physics.
- Setup directly relates to (NP-hard) number partitioning problem.
- Feasibility of quantum annealing shown for small system (6 spins plus phonons) using exact diagonalization.
- Scales well within a semiclassical approximation: Polynomial increase of annealing time.

Thank you!