First Steps in the Statistical Analysis of Quantum Adiabatic Computations

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Quantum Computing

• time dependent Schrödinger equation evolves states

$$|\Psi(t) > e^{\frac{i}{\hbar}H(t)(t-t_0)}|\Psi(t_0) >$$

• lets consider two level systems which maps the bits $b_i = 0, 1$ of a classical computer to quantum "Ising" spins $\sigma_i^z = -1, +1$

$$\sigma_i^z = 1 - 2b_i$$

with a spin wave function that has 2^N complex components for N spins

- can one benefit from the simultaneous i.e., parallel in time evolution of all these components ?
- answer in "canonical" quantum computing: if one is able find a physical device, that is able to implement logical gates on Q-bits: yes,
 for very specific mathematical problems

Quantum Computing

- very specific mathematical problem: Shor's algorithm: Peter W. Shor (ATT Research), "Polynomial-Time Algorithms for Prime Factorization and Discrete Logarithms on a Quantum Computer", quant-ph/9508027 (1995).
- it is however very hard to build a quantum computer from
 trapped ions, NMR spins, Quantum Dots, Josephson Junctions in a superconductor, ...

because a large number of logical gates has to be implemented with high precision in a coherent state for long time

• Quantum Adiabatic Algorithm: forget about logical gates: let a quantized spin system evolve into its ground-state with a Quantum Hamiltonian, whose classical counterpart parametrizes a optimization problem of the NP-hard category

NP - hard : computational effort $\propto e^{+\text{const}N}$

Quantum Adiabatic Algorithm

it has been conjecture by famous people, that the QA algorithm could solve general optimization problems in polynomial time: E. Farhi, J. Goldstone, S. Gutmann, J. Lapan, A. Lundgren and D. Preda, Science 292 (2001) 472; T. Kodawaki and H. Nishimori, Phys. Rev. E 58 (1998) 5355.
-methods : exact diagonalization, real time Schrödinger equation solution for few spins, complexity ∝ N² for N = 24 spins

-recently : A.P. Young, S. Knysh, V.N. Smelyanskiy, Phys. Rev. Lett. 101, 170503(2008) : support for polynomial scaling up to N = 128-just in October 2009: Young et al., "First order phase transition in the Quantum Adiabatic Algorithm", arXiv:0910.1378v1 at N = 256.

Quantum Adiabatic Alg. Basics

- a system remains in instantaneous energy eigenstate if a given perturbation is acting on it slowly enough, M. Born and V. A. Fock (1928), "Beweis des Adiabatensatzes"; C. Zener (1932), "Non-adiabatic Crossing of Energy Levels".
- the Quantum Adiabatic Hamiltonian is a sum

 $H_{QA} = [1 - \lambda] H_D + \lambda H_P \quad 0 \le \lambda \le 1$

- of the driver Hamiltonian $H_D = -\sum_i \sigma_x$ (transverse field)
- and the problem Hamiltonian H_P , with difficult groundstate calculation
- λ : QA control parameter with time-schedule e.g.,

$$\lambda(t) = \frac{t}{\mathcal{T}_0} \quad 0 \le t \le \mathcal{T}_0$$

how large the scale T_0 has to be, that an instantaneous eigenstate at groundstate energy for $\lambda = 0$ stays in the ground state up to $\lambda = 1$?

Quantum Adiabatic Alg. Basics

• Answer: the QA Hamiltonian has a spectrum and the mass-gap

$$\Delta m(\lambda) = m_1(\lambda) - m_0(\lambda)$$

sets the scale

• in particular there exists a minimum gap on λ -space

$$\Delta m_{\min} = \{\min_{\lambda} \Delta m(\lambda)\}$$

and with avoided level crossings

$$\mathcal{T}_0 >> \frac{\mathrm{const}}{\Delta m_{\min}^2}$$

the QA algorithm is expected to converge !

 the invariant main difficulty possibly remains: a zero temperature quantum phase transition with small values of the gap at some value λ* !, in particular first order phase transitions will kill polynomial scaling

The Working Program

- define a classical optimization problem, that
 - has a Ising Hamiltonian
 - has a unique ground state solution
 - is NP hard, $\rightarrow 3-SAT$, a satisfiability problem
- choose an driver Hamiltonian \rightarrow transverse field
- and quantize that Ising model in the imaginary time formulation and determine its minimum mass-gap within λ space → Monte Carlo sampling at few hundred spins (at least in principle)
- compare the complexities classical vs. quantum, with increasing N_{spin}

3 SAT

• given three Ising spins, the three point function

 $h_{\text{Clause}}^3(s_1, s_2, s_3) = \frac{1}{8}(2 - s_1 - s_2 - s_3 + s_1 s_2 + s_1 s_3 + s_2 s_3 - s_1 s_2 s_3)$

only is one $h_{\text{Clause}} = 1$ if $s_1 = s_2 = s_3 = -1$, otherwise it is $h_{\text{Clause}}^3 = 0$

- it is a Ising spin version of the Boolean expression $b_1.OR.b_2.OR.b_3$
- in Boolean algebra one forms M of such 3 clauses on a set N bits and in addition allows for logical negation, the α clause possibly has the form

$$b_{\alpha_1}.OR.\overline{b_{\alpha_2}}.OR.b_{\alpha_3}$$

and one asks, whether M of such clauses can be satisfied simultaneously (logical .AND.)

3 SAT

• Ising Hamiltonian on $s_1, ..., s_N$

$$H_p = \sum_{\alpha=1}^{M} h_{\text{Clause}}^3(\epsilon_{\alpha_1} s_{\alpha_1}, \epsilon_{\alpha_2} s_{\alpha_2}, \epsilon_{\alpha_3} s_{\alpha_3})$$

with $\epsilon_{\alpha_i} = \pm 1$ for i = 1, 2, 3.

a choice of the index array α_i , i = 1, 2, 3 for $\alpha = 1, ..., M$ and of ϵ_{α_i} is called a realization -or- incidence

we choose (non-universal)

- realizations at $M = 5 \times N$ (percolation threshold at $M/N \approx 4.2$ in random 3-SAT)
- we construct forced incidences and filter for unique satisfying assignments : number of ground states exactly one
- random but uniform distribution of ϵ spin to clause assignment $h(n) = \langle \sum_{\alpha,i} \delta^1(\epsilon_{\alpha_i}\alpha_i - n) \rangle_{\text{Realizations}} = \text{constant}$

Findings Classical

• we do a multicanonical simulation of the classical theory for many realizations and measure an ensemble of ergodicity time scales $\tau_{erg,i}$ = 1, ..., N_{meas} for "tunneling" in-between $H_{P,min} = 0$ and $H_{P,max}$, forth and back, in units of MONTE CARLO STEPS the histogram

$$h(\tau_{erg}) = \mathcal{N}^{-1} \sum_{i} \delta^{1}(\tau_{erg,i} - \tau_{erg})$$

exhibits <u>"fat tails"</u> $h(\tau_{erg}) \propto e^{-\tau_{erg}/\tau_{erg,exp}}$ with an exponential decay ergodicity time scale $\tau_{erg,exp}$, characterizing each incidence

• similar "fat tails" are observed in the distribution of ergodicity time values $\tau_{erg,exp}$ within the ensemble of incidences !

classical complexity

logarithmic distribution $P(\tau_{erg})$ with fat tails of ergodicity time scales τ_{erg} in <u>multicanonical simulations</u> as a function of the incidence for N = 20 and M = 100



classical complexity

logarithmic distribution $P(\tau_{erg, exp})$ in ensembles of incidences for "exponential decay" ergodicity time scales $\tau_{erg, exp}$ in <u>multicanonical simulations</u> as a function of the number of spins n for r = M/N = 5



classical complexity

• the complexity of the classical problem roughly doubles if $\Delta N \approx \ln 2 \times 10 = 6 - 7$ spins are added to the theory ! (Very, very preliminary !)



Quantization

- Trotter time m = 0, ..., L_τ 1, step Δτ, β = L_τΔτ = T⁻¹, p.b.c.
- Boltzmann factor: $e^{-\beta H}$

$$-\beta\lambda H_P \to -\lambda \sum_{m=0}^{L_{\tau}-1} H_P(\{\sigma_i^z(\tau_m)\})\Delta\tau$$

with driver Hamiltonian $H_D = -\sum_i \sigma_i^x$

$$-\beta(1-\lambda)H_D \to \kappa_\tau \sum_{m=0}^{L_\tau - 1} \sum_{i=1}^N \sigma_i^z(\tau_m)\sigma_i^z(\tau_m + 1)$$

$$e^{-2\kappa_{\tau}} = \tanh(\Delta \tau [1 - \lambda])$$

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overlap order parameter

to the groundstate on the time-slice

$$\mathcal{O}(\tau_m) = \frac{1}{N} \sum_{i=1}^{N} \sigma_i^z(\tau_m) \sigma_i^z|_{\text{Groundstate}}$$

correlation function

$$\Gamma(\tau) = \frac{1}{L_{\tau}} \sum_{m=0}^{L_{\tau}-1} \mathcal{O}(\tau_m) \mathcal{O}(\tau_m + \tau)$$

gap and order parameter for large τ

$$\Gamma(\tau) \propto e^{-\Delta m(\lambda)\tau} + ||\mathcal{O}_{\text{OrderParameter}}||^2$$

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propagator in k-space

INCIDENCE=0001, $L_{\tau} = 128$, $\lambda = 0.6742$: <u>almost massless !</u>



propagator in k-space

INCIDENCE=0179, $L_{\tau} = 128$, $\lambda = 0.5539$: <u>massive !</u>



mass gap and order parameter

INCIDENCE=0001, $L_{\tau} = 128$, $\lambda = 0.6742$: large quantum complexity !



mass gap and order parameter

INCIDENCE=0179, $L_{\tau} = 128$, $\lambda = 0.5539$: small quantum complexity !



quantum versus classical

Quantization does not apparently boost the efficiency of the optimization problem solver !



Conclusion

in statistical physics there exists a research area, which is cornered by

NP-hard optimization problems given by H_P in terms of Ising spins
the future possibility to built devices that run quantum H_P
a large theory space as parametrized by the form of the driver
Hamiltonian H_D
one would then like to know : is there a minimum mass-gap, that only is

one would then like to know : is there a minimum mass-gap, that only is polynomial small in the number of degrees of freedom ?

• 3 SAT is a problem leaned to mathematics/informatics: its computational demanding (we have realizations for hundred spins, where we cannot find the known groundstate with stochastic searches)

-first preliminary results indicate, that Quantum Adiabatic Calculations with transverse field do not improve the situation in 3 SAT

-P. Young et. al. study Exact Cover, which is a weaker problem