Introduction	Classical 00	Spectrum 000	Ground state	Finite <i>T</i>	Other models	Conclusions

A solvable model of quantum random optimization problems

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Introduction	Classical 00	Spectrum 000	Ground state	Finite <i>T</i>	Other models	Conclusions
Outline						

Introduction

- Definition

 - Analysis of the classical Hamiltonian

- Hard constraints
- Soft constraints
- Exact diagonalization
- Distribution of cluster energies
 - Cluster ground state

Introduction	Classical	Spectrum	Ground state	Finite T	Other models	Conclusions

Investigation of the performances of quantum adiabatic computations led to two sets of results on the spectrum of quantum constraint satisfaction problems.

Consider a model Hamiltonian acting on N qubits, of the form:

$$H = H_P + \Gamma H_Q = H_P - \Gamma \sum_{i=1}^N \sigma_i^x$$

with H_P "problem" Hamiltonian.



• $H_P=1$ -in-3-SAT: Altshuler et al. 2009; Farhi et al. 2009

Both phenomena are potentially dangerous for quantum algorithms, since they lead to exponentially small gaps.

Introduction	Classical	Spectrum	Ground state	Finite T	Other models	Conclusions

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1. The existence of a first order transition between a "Quantum Paramagnetic" and a "Classical Paramagnetic" / "Spin Glass" phase at T=0 by varying Γ

- *H*_p=REM: Goldschmidt 1988; Jörg et al. 2008; Farhi et al. 2010
- H_P=p-spin glass: Nieuwenhuizen and Ritort, 1998; Biroli and Cugliandolo, 2001; Cugliandolo et al. 2001
- *H*_P=1-in-3-SAT: Young et al. 2009
- H_P=XORSAT: Jörg et al. 2009

2. The existence of level crossings between different ground states (in the spin glass phase), related to "Many Body Localization"

- H_P=WMIS (Weighted Max Independent Set): Amin and Choi, 2009;
- H_P=1-in-3-SAT: Altshuler et al. 2009; Farhi et al. 2009

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Introduction	Classical	Spectrum	Ground state	Finite T	Other models	Conclusions

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Introduction	Classical	Spectrum	Ground state	Finite T	Other models	Conclusions
	00	000	00			

Two possible approaches have been used:

- "Worst case": look to particularly dangerous or difficult instances
- "Typical case": choose your favorite ensemble of instances and study properties of typical instances

Here we focus on a typical case study. The advantage is that one can sometimes obtain analytically the typical properties using statistical mechanics.

In natural ensembles of random classical problems H_P (random *k*-SAT, coloring of random graphs), statistical mechanics investigations showed two distinct phase transitions:

- SAT-UNSAT phase transition: typical instances have either an exponential number of solutions (in the SAT phase) or no solutions (in the UNSAT phase)
- **Clustering transition**: the exponentially many solutions are arranged in an exponential number of distinct clusters

Introduction	Classical 00	Spectrum 000	Ground state	Finite T	Other models	Conclusions

Previous studies focused on models that have a unique ground state. Some studied the first order transition, others the level crossings.

Looking for a unified picture
• Is the first order transition present in typical instances?
• Are level crossings present in typical instances?
 Is it possible to observe the two phenomena in the same model? Are they distinct?
• Do the large degeneracy of solutions and their clustering play a role?

A toy model for random constraint satisfaction problems

- Allows to describe easily the structure of classical problems (k-SAT, COL)... [H_P]
- \bullet ...and to understand what is the impact of quantum fluctuations! $[{\cal H}_P+\Gamma {\cal H}_Q]$

Introduction	Classical 00	Spectrum 000	Ground state	Finite <i>T</i>	Other models	Conclusions
Outline						



- A toy model for random constraint satisfaction problems
- Definition
- Analysis of the classical Hamiltonian

3 Spectrum of the quantum Hamiltonian at finite N

- Hard constraints
- Soft constraints
- Exact diagonalization

4 Ground state in the thermodynamic limit

- Distribution of cluster energies
- Cluster ground state
- Finite temperature
- Application to other models



Introduction	Classical 00	Spectrum 000	Ground state	Finite <i>T</i>	Other models	Conclusions
Outline						



- A toy model for random constraint satisfaction problems
 - Definition
- Analysis of the classical Hamiltonian
- Spectrum of the quantum Hamiltonian at finite Λ
 - Hard constraints
 - Soft constraints
 - Exact diagonalization
- Ground state in the thermodynamic limit
 Distribution of cluster energies
 - Cluster ground state
- 5 Finite temperature
- 6 Application to other models

Conclusions

Introduction	Classical	Spectrum	Ground state	Finite T	Other models	Conclusions
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Random Subcubes Model

αd

 α_{sep}

 α_{c}

 α_{s}

(Mora and Zdeborová, 2008)

Definition of the Hamiltonian H:

- Hilbert space \mathcal{H} of N qubits, in the basis of σ_i^z : $|\underline{\sigma}\rangle = |\sigma_1 \cdots \sigma_N\rangle$
- Cluster $A = \{ |\underline{\sigma}\rangle | \forall i, \sigma_i \in \pi_i^A \} \subset \mathcal{H}, \pi_i^A$ i.i.d. random $\pi_i^A = \{-1\}$ or $\{1\}$ with probability p/2 ("frozen") $\pi_i^A = \{-1, 1\}$ with probability 1 p ("free")
- $S = \bigcup_{i=1}^{2^{N(1-\alpha)}} A_i$, union of $2^{N(1-\alpha)}$ independent clusters
- Assign an energy Ne(A) to each cluster: $H_A|\underline{\sigma}\rangle = Ne(A)|\underline{\sigma}\rangle$ if $|\underline{\sigma}\rangle \in A$, $H_A|\underline{\sigma}\rangle = 0$ otherwise
- Assign a penalty NV to configurations that are not in a cluster: $H_V |\underline{\sigma}\rangle = NV |\underline{\sigma}\rangle$ if $|\underline{\sigma}\rangle \notin S$, $H_V |\underline{\sigma}\rangle = 0$ otherwise
- Problem Hamiltonian: $H_P = H_V + \sum_{i=1}^{2^{N(1-\alpha)}} H_{A_i}$

• Total Hamiltonian:
$$H = H_P - \Gamma \sum_{i=1}^N \sigma_i^x$$



Classical model ($\Gamma = 0$). $S = \cup_{i=1}^{2^{N(1-\alpha)}} A_i$ with $|S| = 2^{Ns_{tot}}$ Topology of the cluster space S



- 2^{Nb} events E_i with $\mathcal{P}(E_i) = 2^{-Na}$
- Union bound: $\mathcal{P}(\cup_i E_i) \leq \sum_i \mathcal{P}(E_i) = 2^{N(b-a)}$ If b < a, the probability of $\cup_i E_i$ is exponentially small
- If the events are independent, and N is the number of true events: $\langle N \rangle = 2^{N(b-a)}, \langle N^2 \rangle = 2^{N(b-a)}(1-2^{-Na})$

Chebyshev's inequality:

 $\mathcal{P}(|\mathcal{N} - \langle \mathcal{N} \rangle| > \epsilon \langle \mathcal{N} \rangle) \le \frac{\langle \mathcal{N}^2 \rangle}{\langle \mathcal{N} \rangle^2 \epsilon^2} = \frac{1 - 2^{-N_{\theta}}}{2^{N(b-a)} \varepsilon^2}$ If b > a, concentration: $\mathcal{N} \sim \langle \mathcal{N} \rangle$, exponentially large







Classical model ($\Gamma = 0$). $S = \cup_{i=1}^{2^{N(1-\alpha)}} A_i$ with $|S| = 2^{N_{\text{stot}}}$ Topology of the cluster space S

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• Entropy of a cluster: $2^{Ns(A)}$, s(A) fraction of free variables. $\mathcal{P}(s(A) = s) = {N \choose Ns} p^{N(1-s)} (1-p)^{Ns}$ independently for each cluster

• Number of clusters with entropy s:

$$\mathcal{N}(s) = 2^{N(1-\alpha)}\mathcal{P}(s) = \begin{cases} 2^{N\Sigma(s)} & \Sigma(s) > 0\\ 0 & \Sigma(s) < 0 \end{cases}$$

$$\Sigma(s) = 1 - \alpha - s \log_2(s/(1-p)) - (1-s) \log_2((1-s)/p)$$

$$\Sigma(s) > 0 \text{ for } s \in [s_{\min}, s_{\max}]$$





Classical model ($\Gamma = 0$). $S = \cup_{i=1}^{2^{N(1-\alpha)}} A_i$ with $|S| = 2^{Ns_{tot}}$ Topology of the cluster space S

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•
$$2^{Ns_{\text{tot}}} = \sum_{A} 2^{Ns(A)} \sim \int_{s_{\min}}^{s_{\max}} ds \, 2^{N[\Sigma(s)+s]} s_{\text{tot}} = \max_{s \in [s_{\min}, s_{\max}]} [\Sigma(s) + s]$$

• $\alpha_c = p/(2-p) + \log_2(2-p)$ $\alpha < \alpha_c$: $s^* \in (s_{\min}, s_{\max})$, $\Sigma(s^*) > 0$ - most states in S belong to one of the exponentially many clusters of size s^* $\alpha > \alpha_c$: $s^* = s_{\max}$, $\Sigma(s^*) = 0$ - most states in S belong to one of the few biggest clusters of size s_{\max}



Introduction	Classical 00	Spectrum	Ground state	Finite <i>T</i>	Other models	Conclusions
Outline						

1 Introduction

- A toy model for random constraint satisfaction problems • Definition
 - Analysis of the classical Hamiltonian

3 Spectrum of the quantum Hamiltonian at finite N

- Hard constraints
- Soft constraints
- Exact diagonalization

Ground state in the thermodynamic limit
 Distribution of cluster energies

Cluster ground state

5 Finite temperature

6 Application to other models

Conclusions

Introduction	Classical 00	Spectrum ●○○	Ground state	Finite <i>T</i>	Other models	Conclusion
					Ο	°

Quantum model with hard constraints Simplest case: $V \rightarrow \infty$, $\alpha > \alpha_{sep}$

Project out the states outside S

Clusters are disjoint and the quantum term does not connect them

- The quantum Hamiltonian is block diagonal in each cluster Diagonal term Ne(A), off-diagonal equal to Ns(A) free spins in transverse field
- Spectrum of a cluster:

 $E(A, k) = Ne(A) + (2k - Ns(A))\Gamma$ k = 0, \dots, Ns(A)

Ground state of a cluster:

 $e_{GS}(A) = e(A) - s(A)\Gamma$

• The energy of a cluster is lowered proportionally to its entropy





Introduction	Classi

Spectrum ○●○ Ground stat

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Other models

Conclusions

Quantum model with soft constraints Next-to-simplest case: finite (large) V, $\alpha > \alpha_{sep}$

At
$$\Gamma = 0$$
: $2^{Ns_{tot}}$ states in S , small energy (S -band)
 $2^N - 2^{Ns_{tot}} \sim 2^N$ not in S , energy NV (V -band)

Perturbation theory for small energy states (S-band)

- Degenerate perturbation theory: start by diagonalizing the perturbation inside each cluster. We already did it in the $V = \infty$ case!
- Clusters are separated, perturbation involves the *V*-band
- $e_{GS}(A) = e(A) s(A)\Gamma \frac{\Gamma^2}{NV}[1-s(A)] + O\left(\frac{\Gamma^4}{N^2V^2}\right)$
- Except around crossings → avoided crossings







Introduction	Classical 00	Spectrum ○●○	Ground state 00	Finite <i>T</i>	Other models	Conclusions
Quantum Next-to-si At Γ	model with implest case: = 0: $2^{Ns_{to}} - 2^{N}$	soft constrain finite (large) t states in \mathcal{S} , $2^{Ns_{\mathrm{tot}}} \sim 2^{N}$ r	Its $V, lpha > lpha_{ m sep}$ small energy (S- not in S, energy	band) NV (V-band)		
Variationa	al argument f	for V-band GS		E		
● Cor →	has the state of	te $ QP\rangle = \prod_{i}^{I}$ $-\rangle)/\sqrt{2}$	$ J_{=1} \rightarrow \rangle_i$	ι, μ		
 It h stat 	as scalar protection in the \mathcal{S} -b	duct $O(2^{-Ns/})$ and	$^2) \rightarrow 0$ with any			X
● lt h <i>⟨QI</i>	as energy P $ H QP angle \sim$ -	-ΓN + NV[1 -	$- O(2^{-Ns_{ m tot}})]$	•		<u> </u>
• e _{GS}	$V_{V,V} \leq V - \Gamma$, · · ·	
Cor e _{GS}	mbining with $V_{V,V} = V - \Gamma$	the previous a $+ O(2^{-\kappa N})$	rgument:			the second

Introduction	Cla

Spectrum 000 Ground stat 00

state Finite

Other models

Conclusions

Quantum model with soft constraints Next-to-simplest case: finite (large) V, $\alpha > \alpha_{sep}$

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 $\begin{array}{ll} \mbox{At } \Gamma = 0 \mbox{:} & 2^{Ns_{\rm tot}} \mbox{ states in } \mathcal{S}, \mbox{ small energy } (\mathcal{S}\mbox{-band}) \\ & 2^N - 2^{Ns_{\rm tot}} \sim 2^N \mbox{ not in } \mathcal{S}, \mbox{ energy } NV \mbox{ } (V\mbox{-band}) \\ \end{array}$

Heuristic argument for V band

- Low rank perturbation X only affects 2^{Nstot} states
- Perturbation "localized" in $|\underline{\sigma}\rangle$ space
- Eigenstates of H₀ are extended
- In the middle of the band there are many states: form localized linear combinations
- Those are mostly affected by X
- All the other states have $O(2^{-\kappa N})$ corrections
- Spectrum of the V-band is that of N free spins in transverse field Γ







Introduction	Classical 00	Spectrum 000	Ground state	Finite <i>T</i>	Other models	Conclusions
Outline						

1 Introduction

- A toy model for random constraint satisfaction problems

 Definition
 - Analysis of the classical Hamiltonian

3 Spectrum of the quantum Hamiltonian at finite Λ

- Hard constraints
- Soft constraints
- Exact diagonalization
- Ground state in the thermodynamic limit
 Distribution of cluster energies
 - Cluster ground state
 - 5) Finite temperature
- 6 Application to other models

Conclusions

Introduction	Classical 00	Spectrum 000	Ground state ●○	Finite T	Other models	Conclusions
						°

Classical model for $N \rightarrow \infty$ $\alpha > \alpha_{sep}$, fixed V - Distribution of cluster energies

To not on internation thermal memory limit we have to a

To get an interesting thermodynamic limit we have to assign the distribution of *classical* energy of clusters:

- $\mathcal{N}(e) = 2^{N\Sigma(e)}$
- $\max_{e} \Sigma(e) = 1 \alpha$, total number of clusters $2^{N(1-\alpha)}$
- $\Sigma(e=0) = \frac{2}{3}(1-\alpha)$, total number of clusters of solutions $2^{N\frac{2}{3}(1-\alpha)}$



Introduction	Classical 00	Spectrum 000	Ground state ●○	Finite T	Other models	Conclusions
						•

Classical model for $N \to \infty$

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Frozen spins are drawn independently for each cluster: $\Sigma(e, s) = \Sigma(e) - s \log_2(s/(1-p)) - (1-s) \log_2((1-s)/p)$



Vanishes for $s = s_{max}(e)$, increasing function of e: bigger clusters at higher energy

Introduction	Classical 00	000	Ground state ○●	Finite I	Other models	Conclusions
Quantum	model for A	$l \rightarrow \infty$				

Quantum model for $N \to \infty$ $\alpha > \alpha_{sep}$, fixed V Ground state energy



- $e_{GS}(A) = e(A) s(A)\Gamma \frac{\Gamma^2}{NV}[1 s(A)] + O\left(\frac{\Gamma^4}{N^2V^2}\right)$
- For $N \to \infty$ $e_{GS}(A) = e(A) \Gamma s(A)$
- $e_{SG}(\Gamma) = \min_A \{e(A) \Gamma s(A)\} = \min_{e \in [0, e_m]} \min_{s \in [s_{\min}(e), s_{\max}(e)]} \{e \Gamma s\}$
- Minimization over s is trivial: $e_{SG}(\Gamma) = \min_{e \in [0, e_m]} \{e - \Gamma s_{\max}(e)\}$ Solve $\frac{ds_{\max}(e)}{de} = \frac{1}{\Gamma}$
- $s_{\max}(e)$ is a monotonically increasing function of e, $\frac{ds_{\max}(e)}{de} > 0$
- For $\Gamma > \left[\frac{ds_{\max}}{de}(e=0)\right]^{-1}$, the minimum is in a different value of e for each Γ A continuum of level crossings!



Level crossings in the spin glass phase

• $e_{SG}(\Gamma) = \min_{e \in [0, e_m]} \{ e - \Gamma s_{\max}(e) \}$ Solv

Solve
$$\frac{ds_{\max}(e)}{de} =$$

- Inset: $e_{GS} + \Gamma s_{max}(e = 0)$ to highlight the crossings in the SG phase
- All thermodynamic functions are analytic in the SG phase
- Reminiscent of "chaos" in temperature in classical spin glasses



A first order transition between the SG (cluster) states and the QP state

- e_{QP} = V Γ
- Transverse magnetization $m_x = s$ classical entropy It has a jump at the transition
- Inverse Participation Ratio: $I = \sum_{\sigma} |\psi(\underline{\sigma})|^4 = 2^{-Ns}$ $\mathcal{I} = -\frac{1}{N} \log_2 I = s = m_x$

Introduction	Classical 00	Spectrum 000	Ground state 00	Finite T	Other models	Conclusions
Outline						

1 Introduction

- A toy model for random constraint satisfaction problems

 Definition
 - Analysis of the classical Hamiltonian

3 Spectrum of the quantum Hamiltonian at finite Λ

- Hard constraints
- Soft constraints
- Exact diagonalization
- Ground state in the thermodynamic limit
 - Distribution of cluster energies
 - Cluster ground state

Finite temperature

Application to other models

Conclusions



Introduction	Classical 00	Spectrum 000	Ground state 00	Finite T	Other models	Conclusions
Outline						

1 Introduction

- A toy model for random constraint satisfaction problems

 Definition
 - Analysis of the classical Hamiltonian

3 Spectrum of the quantum Hamiltonian at finite Λ

- Hard constraints
- Soft constraints
- Exact diagonalization

Ground state in the thermodynamic limit

- Distribution of cluster energies
- Cluster ground state

Finite temperature

Application to other models

Conclusions

Introduction	Classical	Spectrum	Ground state	Finite T	Other models	Conclusions

3-XORSAT with c = 3



T.Jörg, F.Krzakala, G.Semerjian, FZ, PRL 104, 207206 (2010)

- XORSAT is an easy problem: a solution can be found in polynomial time using Gaussian elimination
- However, it is hard for local search algorithms
- In particular, in the UNSAT phase finding the ground state is hard
- XORSAT on a regular random graph is a "locked" model: solutions are isolated (clusters have no entropy)
- We do not expect level crossings of the type discussed above
- Exact solution in the thermodynamic limit via the cavity method: first order transition
- Comparison with Monte Carlo shows there are no level crossings
- Similar results for 2-in-4-SAT (F.Krzakala, unpublished)

Introduction	Classical 00	Spectrum 000	Ground state	Finite <i>T</i>	Other models	Conclusions

Work in progress:

- Study of a model of lattice glass on the Bethe lattice: the quantum Biroli-Mézard model.
 - Here clusters have internal entropy: same phase diagram of the quantum subcubes model. $% \label{eq:cluster}$

(L.Foini, G.Semerjian, FZ, in preparation)

• Preliminary studies of a quantum version of the coloring problem (with G.Semerjian and F.Krzakala)

Introduction	Classical 00	Spectrum 000	Ground state 00	Finite <i>T</i>	Other models	Conclusions
Outline						

1 Introduction

- A toy model for random constraint satisfaction problems

 Definition
 - Analysis of the classical Hamiltonian

3 Spectrum of the quantum Hamiltonian at finite Λ

- Hard constraints
- Soft constraints
- Exact diagonalization
- Ground state in the thermodynamic limit
 Distribution of cluster energies
 - Cluster ground state
- 5 Finite temperature
- 6 Application to other models



Introduction	Classical	Spectrum	Ground state	Finite T	Other models	Conclusions

A very simple model with a very complex phase diagram

- A spin glass phase, level crossings induced by entropy-energy competition
- A first order transition to a quantum paramagnetic phase
- A re-entrant behavior of the glass transition line

Allow to rationalize previous results

First order phase transition (signaled by a jump in m_x) is a generic phenomenon: XORSAT, 1-in-3-SAT (Young), coloring, ... Is it a many-body localization transition? Jump in N⁻¹ log₂ I.

Two different mechanisms induce level crossings:

 one based on energetic effects only (Amin-Choi, Altshuler et al., Farhi et al.)
 the one we identified, based on an energy-entropy competition

 Probably both are at work in typical instances of complicated problems such as k-SAT or coloring.

 In locked problems (XORSAT or 2-in-4-SAT on regular graphs), cluster are points; in this case we don't find evidence for level crossings on typical instances.

Introduction Cla	assical S	Spectrum	Ground state	Finite T	Other models	Conclusions

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Introduction	Classical 00	Spectrum 000	Ground state 00	Finite <i>T</i>	Other models	Conclusions

Many of these phenomena are strongly model-dependent!

Two possible mechanisms that lead to difficulties for quantum algorithms have been identified but...

...it is difficult to draw universal conclusions! One should look carefully to the structure of the classical problem Hamiltonian H_P

Thank you for your attention!

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