## Quantum combinatorial algorithms

Team 14

Numerical Linear Algebra, Skoltech

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Motivations	Formulations	Methods	Results	Discussions



#### 2 Formulations







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Motivations Formulations Methods Results Discussions

## Success of Combinatorial model

$$Model = \begin{pmatrix} graph \\ object_1 \end{pmatrix} + \begin{pmatrix} site \\ object_2 \end{pmatrix}$$
• Ising-like models= $\begin{pmatrix} structure \\ bond \end{pmatrix} + \begin{pmatrix} charge \\ spin \end{pmatrix}$  describes magnetism.
• Hopfield model= $\begin{pmatrix} neural \\ network \end{pmatrix} + \begin{pmatrix} neuron \\ firing \end{pmatrix}$  comp.neuroscience

Tensor network describes approximate computational model.
 →Phase transition

#### Combinatorial problems are NP-hard.

Big question

How far combinatorial (approximation) algorithms could go?

Motivations	Formulations	Methods	Results	Discussions
Combinatoria	l object			

- Ising model=Chromatic number[Welsh and Merino, 2000] Ising model is NP hard. Graph polynomial is hard. Zero limit of Ising model is finding coloring from the polynomial.
- Tensor network

Most tensor problems are NP-hard[Hillar and Lim, 2013] Tensor network algorithms are also complexity hard APPROXIMATION

 $\rightarrow$  Tensor network Renormalization Group

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Quantum chromatic number

Graph coloring game(Classical chromatic number  $\chi$ ) Alice wins the game if she can *graph-color* without interaction.

Quantum graph coloring  $game(\chi_q)$ Graph coloring game+Quantum pseudotelepathy(entanglement)

•  $\zeta \leq \chi_q \leq \chi$ ,  $minV(G_{known}) = 1609^{Avis2006}, 18^{Cameron2007}$ 

Problem statement 1

Is there graph smaller than 18 whose quantum and classical chromatic numbers are different?

Motivations	Formulations	Methods	Results	Discussions
Thus spoke Iv	van, Graph col	oring is		

- , with some optimization methods,
  - Eigenvalues of Laplacian[Wilf-Hoffman's bound]

$$L = Id - A = (_i = d - \mu_i) \rightarrow d_{ave} \leq \mu_1 = \max_{x \in T_A \atop x^T x} \leq d_{max}$$
$$_{max}(A) \geq_{max} (A') \geq_{min} (A') \geq_{min} (A), \ [\mu_1] + 1 \leq \chi(G) \leq \frac{\mu_1 - \mu_n}{-\mu_n}$$

Defining coloring relation

matrix k coloring, vector k coloring(equivalent) vector  $k + \epsilon$  coloring can be constructed in  $O(nlog(\frac{1}{\epsilon})$  with Cholesky factorization (combinatorial optimization relaxation-maxcut algorithms-goesmanwiliam)

Formulations

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#### And thus spoke Ivan, Tensor RG is



Formulations

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### Square lattice



- SVD decomposition
- Reduce rank
- Merge
- Calculate energy

Formulations

Methods

Result

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## Square lattice[Cook,MIT project15]



Figure 1: Square lattice tensor network renormalization group

## Graph coloring

- $O(3^N)$  : coloring,  $O(2^N N^2)$  : MAXclique
- Greedy heuristic algorithm with logarithmic error bound
  - Set cover based approach
  - Bipartite coloring optimization
  - Local search

Formulations

Methods

Result

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Discussions

## TRG on Honeycomb lattice



- Geometrical replacement
- SVD decomposition
- Reduce rank
- Merge
- Calculate energy

Formulations

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# Chromatic number results(18)





#### Tensor network renormalization result (Honeycomb lattice)



Figure 2: Honeycomb latice tensor network renormalization group



There exist  $n^{\in \mathbf{N}}$  such that  $\forall G, V(G) \leq n \rightarrow |\zeta(G) - \chi(G)| = 1$ 



Motivations	Formulations	Methods	Results	Discussions
Real Discussio	on			

- What is the polynomial extension of quantum chromatic number?
  - What is the complexity class?
  - How does it related to physical phenomenon?
  - Can tensor network explain (quantum) communication complexity?

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- Nonlocal game(=graph coloring game)
- Bell's inequality(Tsirelson's conjecture)

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