

# Quantum combinatorial algorithms

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1 Motivations

2 Formulations

3 Methods

4 Results

5 Discussions

# Success of Combinatorial model

$$\text{Model} = \binom{\text{graph}}{\text{object}_1} + \binom{\text{site}}{\text{object}_2}$$

- Ising-like models =  $\binom{\text{structure}}{\text{bond}} + \binom{\text{charge}}{\text{spin}}$  describes magnetism.
- Hopfield model =  $\binom{\text{neural}}{\text{network}} + \binom{\text{neuron}}{\text{firing}}$  comp. neuroscience.
- Tensor network describes approximate computational model.  
→ Phase transition

Combinatorial problems are NP-hard.

Big question

How far combinatorial (approximation) algorithms could go?

# Combinatorial 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

→ Tensor network Renormalization Group

# 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)

- $\zeta \leq \chi_q \leq \chi$ ,  $\min V(G_{\text{known}}) = 1609^{\text{Avis2006}}, 18^{\text{Cameron2007}}$

Problem statement 1

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

# Thus spoke Ivan, Graph coloring is

, with some optimization methods,

- Eigenvalues of Laplacian[Wilf-Hoffman's bound]

$$L = Id - A = (d_i - \mu_i) \rightarrow d_{ave} \leq \mu_1 = \max \frac{x^T A x}{x^T x} \leq d_{max}$$

$$\max(A) \geq \max(A') \geq \min(A') \geq \min(A), [\mu_1] + 1 \leq \chi(G) \leq \frac{\mu_1 - \mu_n}{-\mu_n}$$

- Defining coloring relation

matrix  $k$  coloring, vector  $k$  coloring(equivalent)

vector  $k + \epsilon$  coloring can be constructed in  $O(n \log(\frac{1}{\epsilon}))$  with

Cholesky factorization

(combinatorial optimization relaxation-maxcut

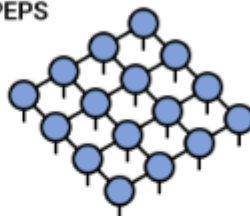
algorithms-goesmanwiliam)

# And thus spoke Ivan, Tensor RG is

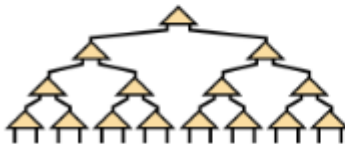
**Matrix Product State /  
Tensor Train**



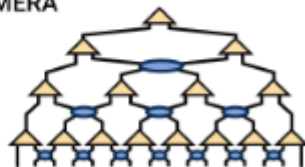
**PEPS**



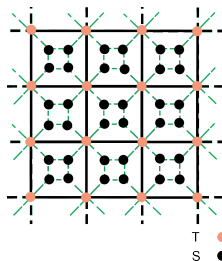
**Tree Tensor Network /  
Hierarchical Tucker**



**MERA**



# Square lattice



- SVD decomposition
- Reduce rank
- Merge
- Calculate energy



# Square lattice[Cook,MIT project15]

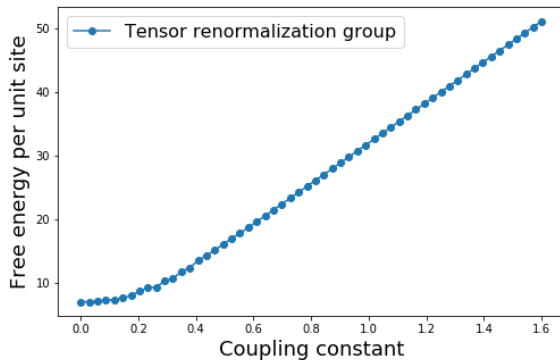
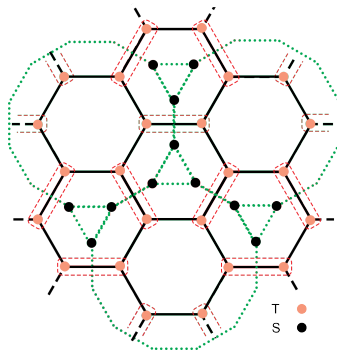


Figure 1: Square lattice tensor network renormalization group

# Graph coloring

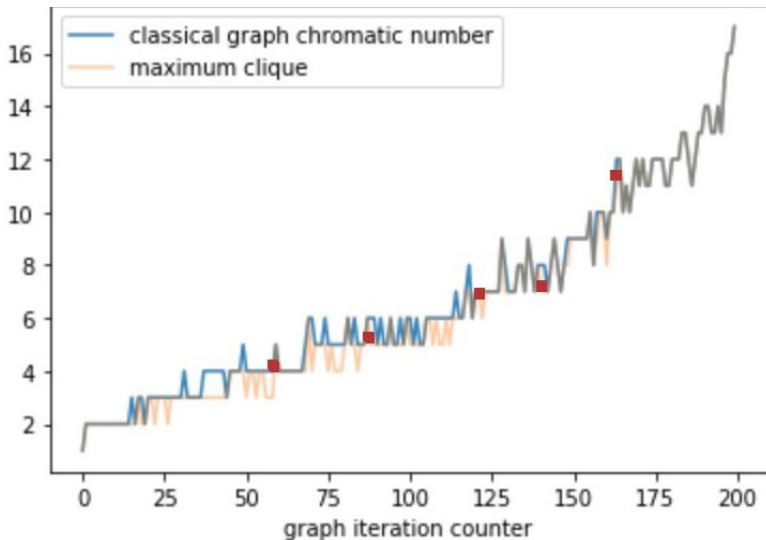
- $O(3^N)$  : *coloring*,  $O(2^N N^2)$  : *MAXclique*
- Greedy heuristic algorithm with logarithmic error bound
  - Set cover based approach
  - Bipartite coloring optimization
  - Local search

# TRG on Honeycomb lattice



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

# Chromatic number results(18)



# Tensor network renormalization result (Honeycomb lattice)

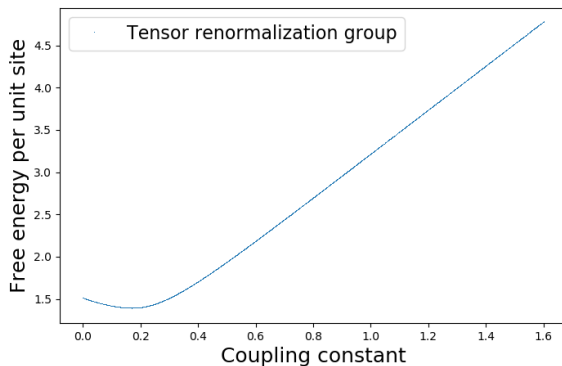
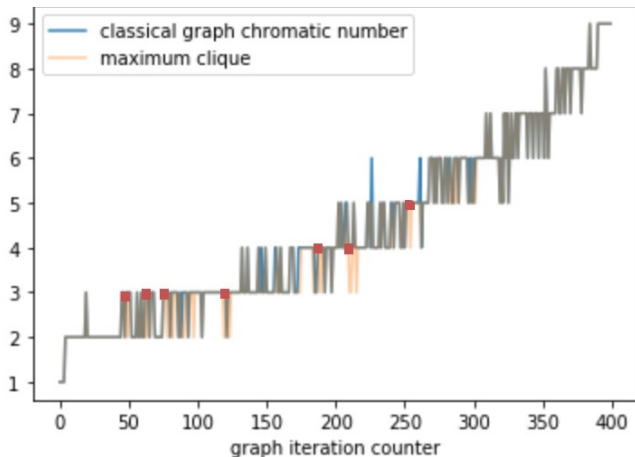


Figure 2: Honeycomb lattice tensor network renormalization group

# Conjecture

Additional NLA project(Ivan's problem)

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



# Real Discussion

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



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