



# Application of Tensor Renormalization Group to Particle Physics

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# Plan of Talk

- Introduction
- Tensor Renormalization Group (TRG)
  - Two Dimensional Ising Model
- Current Status for TRG Studies in Particle Physics
- Application to Complex Actions
  - 2D pure U(1) Gauge Theory w/  $\theta$ -Term
- Summary



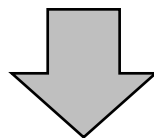
# Introduction

What is Tensor Network (TN) Scheme?

Theoretical and numerical methods for high precision analyses of many body problems with tensor network formalism

What is different from conventional methods?

Free from sign problem and complex action problem in Monte Carlo method  
Computational cost for  $L^D$  system size  $\propto D \times \log(L)$   
Direct treatment of Grassmann numbers  
Direct evaluation of partition function  $Z$  itself



Possible applications in particle physics:

Light quark dynamics in QED/QCD, Finite density QCD,  
Strong CP problem, Chiral gauge theories, Lattice SUSY etc.

Also many applications in condensed matter physics



# Tensor Renormalization Group (TRG)

Levin-Nave

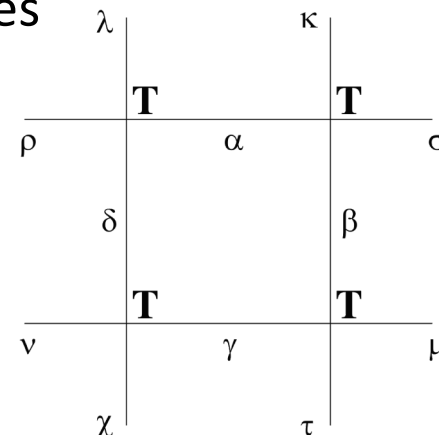
PRL99(2007)120601

Explain the algorithm with 2D Ising model with N sites

$$\text{Hamiltonian } H = \sum_{\langle i,j \rangle} s_i s_j \quad s_i \pm 1$$

$$\text{Partition Function } Z = \sum_{\{s_i\}} \exp(-\beta H)$$

$$= \sum_{\alpha, \beta, \gamma, \delta, \dots=1}^2 T_{\alpha, \lambda, \rho, \delta} T_{\sigma, \kappa, \alpha, \beta} T_{\mu, \beta, \gamma, \tau} T_{\gamma, \delta, \nu, \chi} \dots$$



Tensor Network formulation

Details of model are specified in initial tensor

The algorithmic procedure is independent of models

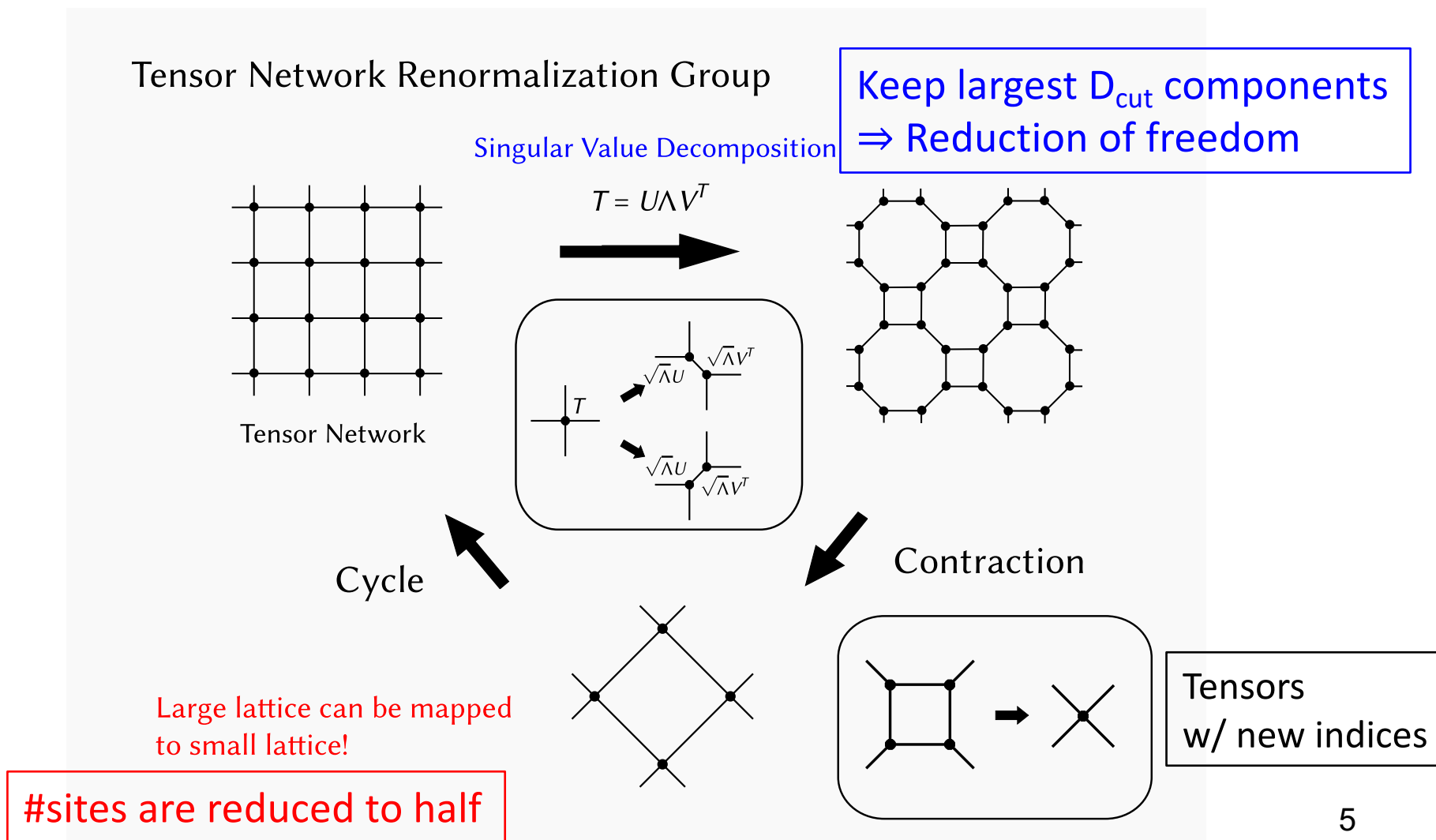
Of course, direct contraction is impossible for large N even with current fastest supercomputer

⇒ How to evaluate the partition function?



# Schematic View of TRG Algorithm

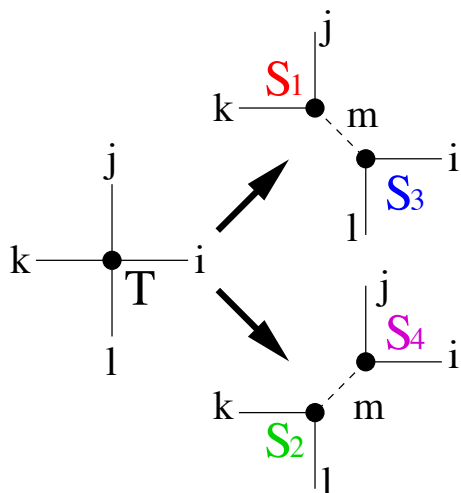
1. Singular Value Decomposition of local tensor  $T$
2. Contraction of old tensor indices (coarse-graining)
3. Repeat the iteration





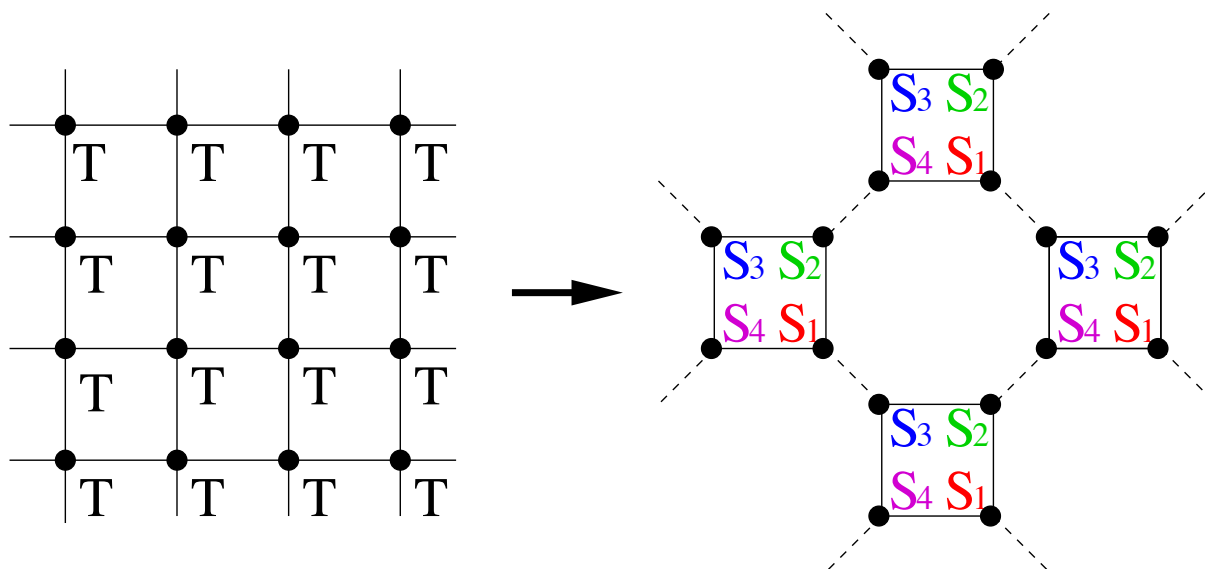
# TRG Algorithm (1)

Singular Value Decomposition of local tensor T



$$T_{i,j,k,l} \Rightarrow T_{\{j,k\},\{l,i\}} = (U\Lambda V^t)_{\{j,k\},\{l,i\}} = \sum_m (U\sqrt{\Lambda})_{\{j,k\},m} (V\sqrt{\Lambda})_{\{l,i\},m} = \sum_m (S_1)_{\{j,k\},m} (S_3)_{\{l,i\},m}$$

$$T_{i,j,k,l} \Rightarrow T_{\{k,l\},\{i,j\}} = (U\Lambda V^t)_{\{k,l\},\{i,j\}} = \sum_m (U\sqrt{\Lambda})_{\{k,l\},m} (V\sqrt{\Lambda})_{\{i,j\},m} = \sum_m (S_2)_{\{k,l\},m} (S_4)_{\{i,j\},m}$$



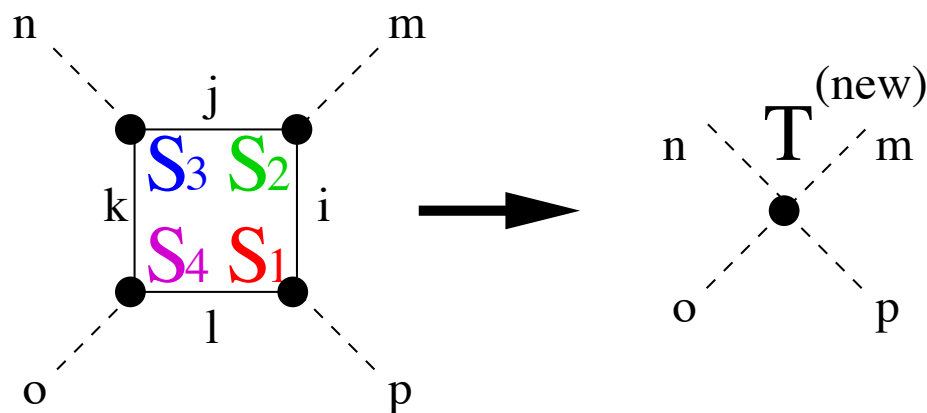


## TRG Algorithm (2)

Keep largest  $D_{\text{cut}}$  components  $\Rightarrow$  Reduction of freedom

$$T_{i,j,k,l} \simeq \sum_{m=1}^{D_{\text{cut}}} U_{\{k,l\},m} \Lambda_m V_{\{i,j\},m}$$

Contraction of old tensor indices of  $S_1, S_2, S_3, S_4$  (coarse-graining)



$$T_{o,n,m,p}^{(\text{new})} = \sum_{i,j,k,l} (S_4)_{\{l,k\},o} (S_3)_{\{k,j\},n} (S_2)_{\{j,i\},m} (S_1)_{\{i,l\},p}$$

#sites are reduced to half



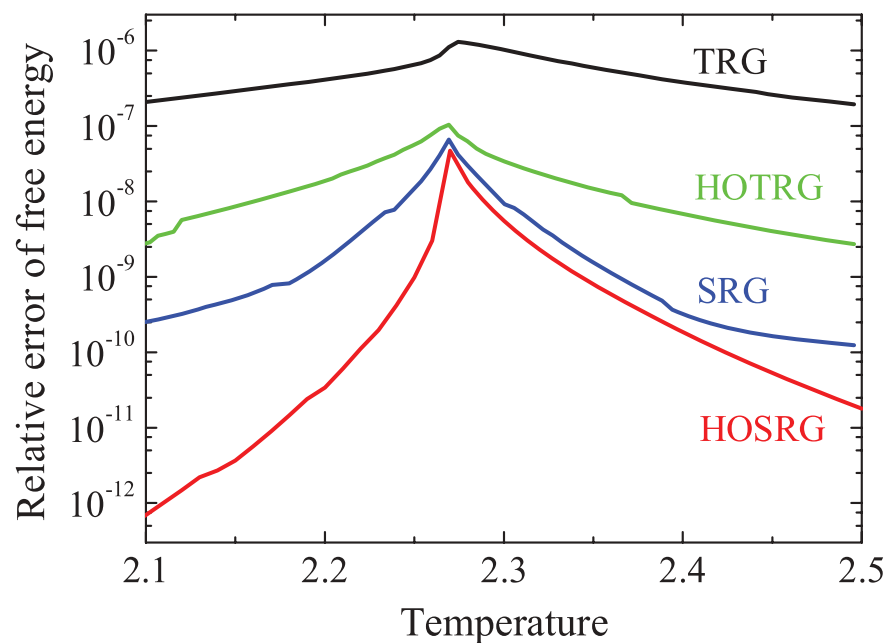
# Numerical test for 2D Ising Model

The key element in the algorithm is low-rank approximation by SVD

$$T_{i,j,k,l} \simeq \sum_{m=1}^{D_{\text{cut}}} U_{\{k,l\},m} \Lambda_m V_{\{i,j\},m}$$

Truncation error is controlled by the parameter  $D_{\text{cut}}$

Free energy on and off the transition point, lattice size= $2^{30 \sim 50}$ ,  $D_{\text{cut}}=24$



Xie et al.  
PRB86(2012)045139

Comparison with analytic results  
Relative error of free energy:  $\leq 10^{-6}$





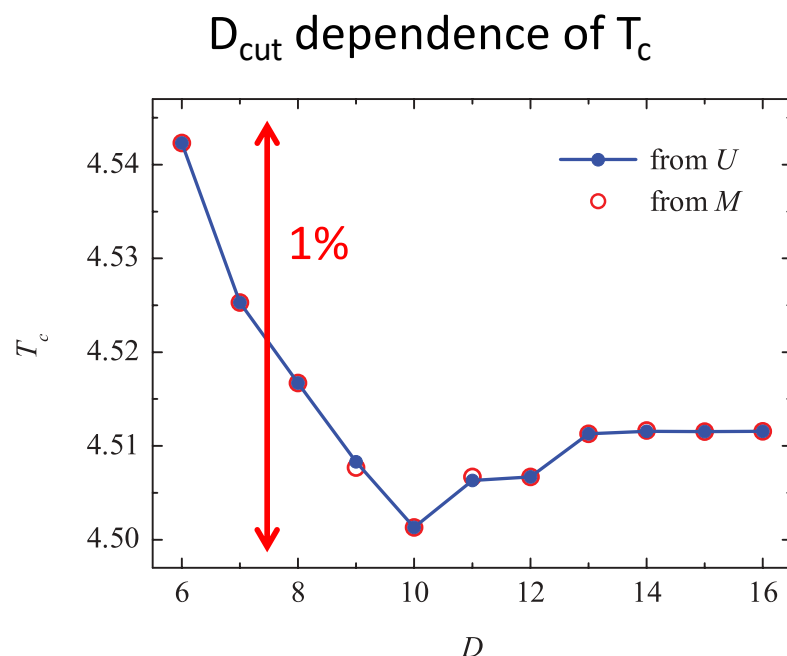
# Study of 3D Ising Model

Xie et al.

PRB86(2012)045139

Higher-Order TRG (HOTRG): applicable to higher dimensional models

Computational cost  $\propto (D_{\text{cut}})^{11} \times \log(V)$



## Comparison with Monte Carlo data

Method	$T_c$
HOTRG ( $D = 16$ , from $U$ )	4.511544
HOTRG ( $D = 16$ , from $M$ )	4.511546
Monte Carlo <sup>37</sup>	4.511523
Monte Carlo <sup>38</sup>	4.511525
Monte Carlo <sup>39</sup>	4.511516
Monte Carlo <sup>35</sup>	4.511528
Series expansion <sup>40</sup>	4.511536
CTMRG <sup>12</sup>	4.5788
TPVA <sup>13</sup>	4.5704
CTMRG <sup>14</sup>	4.5393
TPVA <sup>16</sup>	4.554
Algebraic variation <sup>41</sup>	4.547

Results show good agreement with Monte Carlo data at high precision



## Collaborators

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Kanazawa U.

D. Kadoh

N. Tsing-Hua U./  
Keio U.



# Application of TRGs to Particle Physics (1)

## 2D models

Ising model: [Levin-Nave, PRL99\(2007\)120601](#)

X-Y model: [Meurice+, PRE89\(2014\)013308](#)

CP(1): [Kawauchi-Takeda, PRD93\(2016\)114503](#)

Real  $\phi^4$  theory:

[Shimizu, Mod.Phys.Lett.A27\(2012\)1250035,](#)

[Kadoh-YK-Nakamura-Sakai-Takeda-Yoshimura, JHEP1905\(2019\)184](#)

Complex  $\phi^4$  theory at finite density:

[Kadoh-YK-Nakamura-Sakai-Takeda-Yoshimura, in preparation](#)

U(1) gauge theory+ $\theta$ :

[YK-Yoshimura, arXiv:1911.06480](#)

Schwinger, Schwinger+ $\theta$ :

[Shimizu-YK, PRD90\(2014\)014508, PRD90\(2014\)074503,](#)  
[PRD97\(2018\)034502](#)

Gross-Neveu model at finite density:

[Takeda-Yoshimura, PTEP2015\(2015\)043B01](#)

N=1 Wess-Zumino model:

[Kadoh-YK-Nakamura-Sakai-Takeda-Yoshimura, JHEP1803\(2018\)141](#)



## Application of TRGs to Particle Physics (2)

### 3D models

Ising: Xie+, PRB86(2012)045139

Potts model: Wan+, CPL31(2014)070503

Free Wilson fermion:

Sakai-Takeda-Yoshimura, PTEP2017(2017)063B07,

Yoshimura-YK-Nakamura-Takeda-Sakai, PRD97(2018)054511

$Z_2$  gauge theory at finite temperature:

YK-Yoshimura, JHEP1908(2019)023

### 4D models

Ising: Akiyama-YK-Yamashita-Yoshimura, PRD100(2019)054510

weak first-order phase transition (not second-order phase transition)



# A Selected Topic on Complex Action

2D pure U(1) gauge theory w/  $\theta$ -term

YK-Yoshimura, [arXiv:1911.06480](https://arxiv.org/abs/1911.06480)

How to treat continuous dof?

Complex action with so-called  $\theta$ -term

Sign problem is really solved?



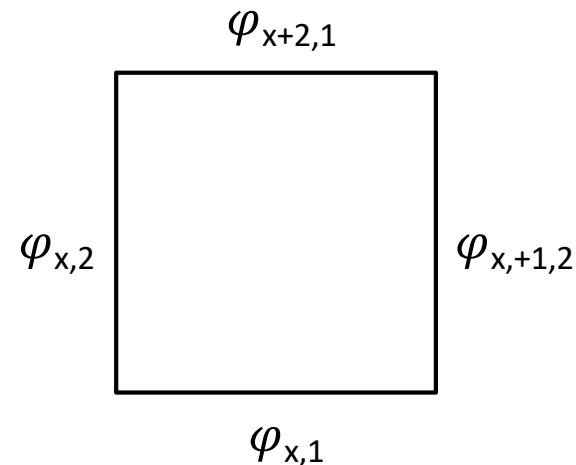
# 2D Pure U(1) Gauge Theory w/ $\theta$ -Term

Lattice action of 2D pure U(1) gauge theory w/  $\theta$ -term

$$S = -\beta \sum_x \cos p_x - \underbrace{i\theta Q}_{\text{complex}}$$

$$p_x = \varphi_{x,1} + \varphi_{x+1,2} - \varphi_{x+2,1} - \varphi_{x,2}$$

$$Q = \frac{1}{2\pi} \sum_x q_x, \quad q_x = p_x \bmod 2\pi$$



Periodic boundary condition  $\Rightarrow Q$  is integer

$$Z = \left( \prod_{x,\mu} \int_{-\pi}^{\pi} \frac{d\varphi_{x,\mu}}{2\pi} \right) \exp(-S)$$

Analytic result

$$Z_{\text{analytic}} = \sum_{Q=-\infty}^{\infty} (z_P(\theta + 2\pi Q, \beta))^V,$$

$$z_P(\theta, \beta) = \int_{-\pi}^{\pi} \frac{d\varphi_P}{2\pi} \exp\left(\beta \cos \varphi_P + i \frac{\theta}{2\pi} \varphi_P\right)$$

Wiese, NPB318(1989)153

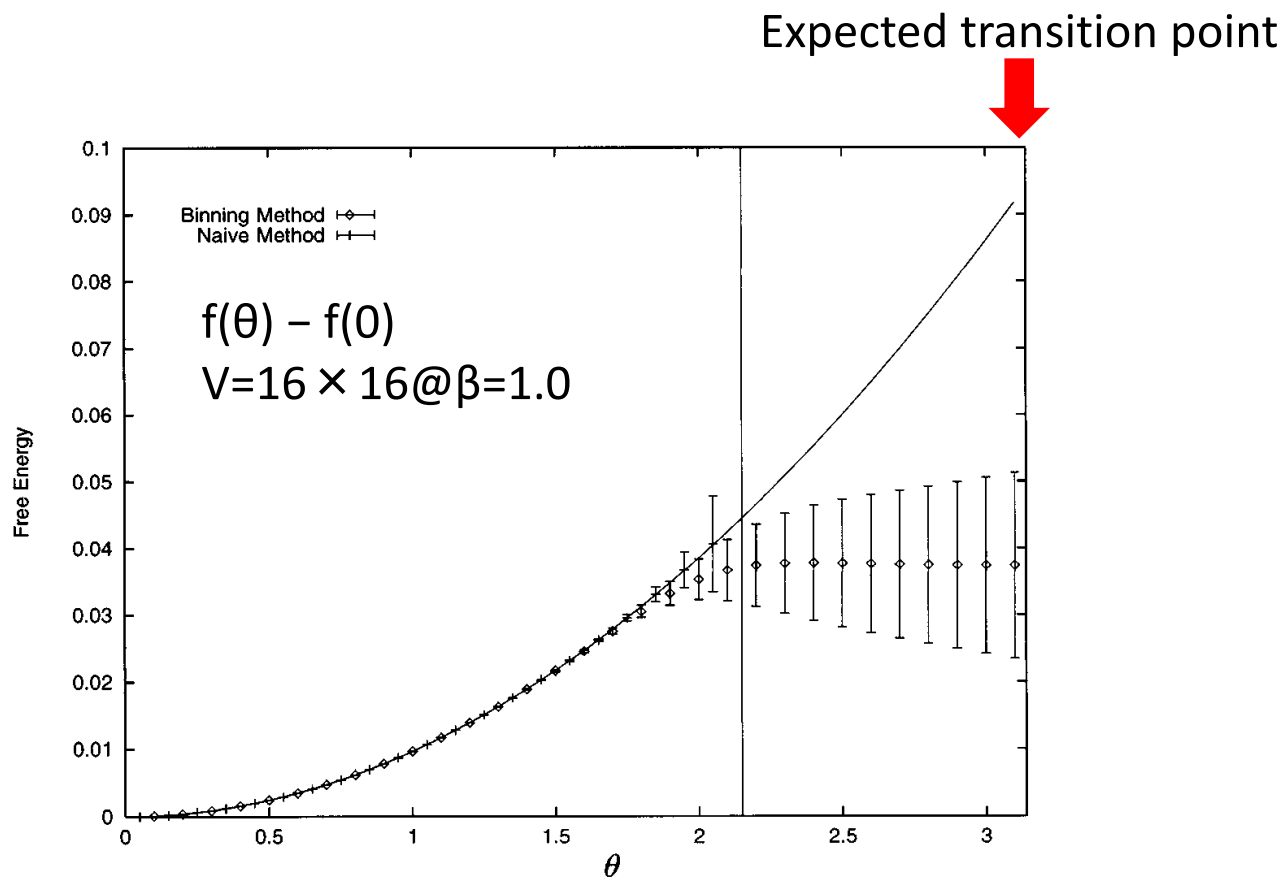
Predict a first order phase transition at  $\theta=\pi$



# Conventional Approach

Plefka-Samuel, PRD56(1997)44

Previous Monte Carlo result for free energy



Doesn't work for  $\theta \gtrsim 0.7\pi$  (difficult near the transition point)

No successful numerical calculation so far



# Tensor Network Representation

YK-Yoshimura, arXiv:1911.06480

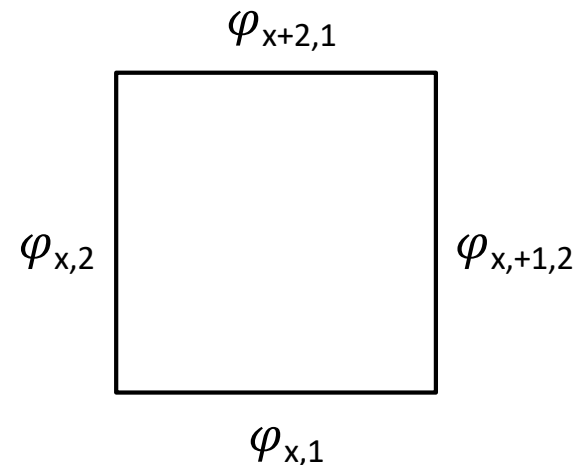
Lattice action of 2D pure U(1) gauge theory w/  $\theta$ -term

$$S = -\beta \sum_x \cos p_x - \underbrace{i\theta Q}_{\text{complex}}$$

$$p_x = \varphi_{x,1} + \varphi_{x+\hat{1},2} - \varphi_{x+\hat{2},1} - \varphi_{x,2}$$

$$Q = \frac{1}{2\pi} \sum_x q_x, \quad q_x = p_x \bmod 2\pi$$

$$Z = \left( \prod_{x,\mu} \int_{-\pi}^{\pi} \frac{d\varphi_{x,\mu}}{2\pi} \right) \exp(-S)$$



Partition function w/ continuous indices

$$\mathcal{T}(\varphi_{x,1}, \varphi_{x+\hat{1},2}, \varphi_{x+\hat{2},1}, \varphi_{x,2}) = \exp\left(\beta \cos p_x + i \frac{\theta}{2\pi} q_x\right)$$

$$Z = \left( \prod_{x,\mu} \int_{-\pi}^{\pi} \frac{d\varphi_{x,\mu}}{2\pi} \right) \prod_x \mathcal{T}(\varphi_{x,1}, \varphi_{x+\hat{1},2}, \varphi_{x+\hat{2},1}, \varphi_{x,2})$$

Discretized partition function w/ Gauss-Legendre quadrature

$$\int d\varphi f(\varphi) \approx \sum_{\alpha=1}^K w_{\alpha} f(\varphi^{(\alpha)})$$

K-th order Legendre polynomial  
 $\varphi^{(\alpha)}$ :  $\alpha$ -th node,  $w_{\alpha}$ : weight

$$T_{ijkl} = \frac{\sqrt{w_i w_j w_k w_l}}{(2\pi)^2} \mathcal{T}(\varphi^{(i)}, \varphi^{(j)}, \varphi^{(k)}, \varphi^{(l)})$$

$$Z \approx \sum_{\{\alpha\}} \prod_x T_{n_{x,1} n_{x+\hat{1},2} n_{x+\hat{2},1} n_{x,2}}$$





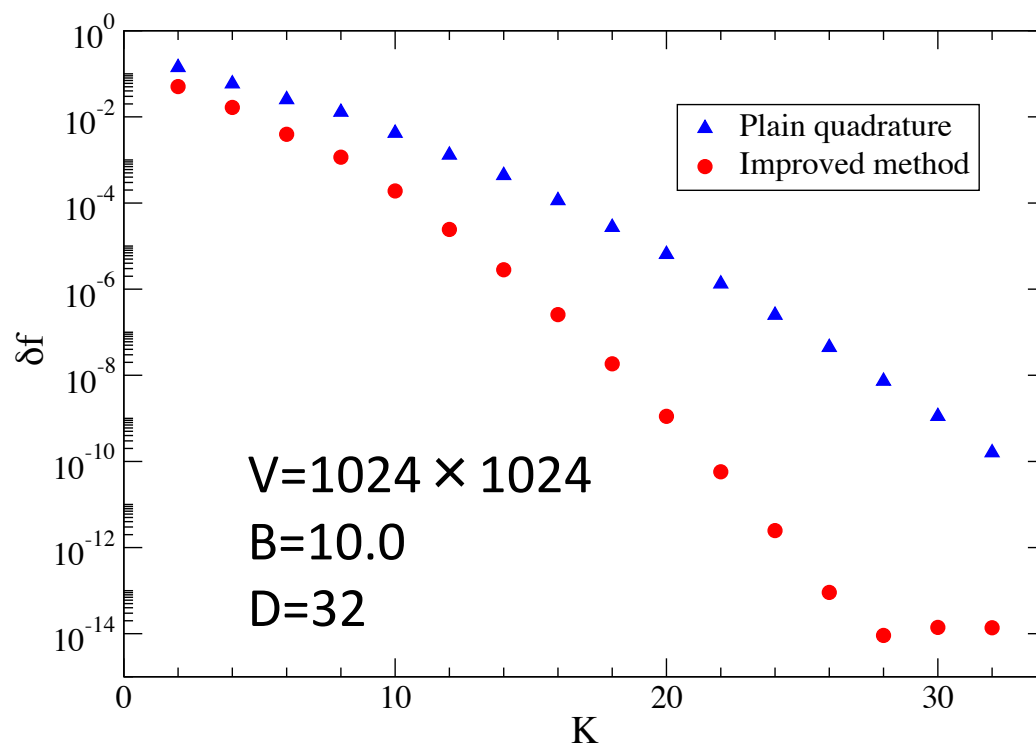
# Free Energy w/ TRG

YK-Yoshimura, arXiv:1911.06480

Relative error

$$\delta f = \frac{|\ln Z_{\text{analytic}} - \ln Z(K, D = 32)|}{|\ln Z_{\text{analytic}}|}$$

Comparison btw TRG results and analytic ones at  $\theta=\pi$  (most difficult point)



$\delta f < 10^{-12}$  @  $(D, K) = (32, 32) \Rightarrow$  sufficient precision



# Topological Charge Density

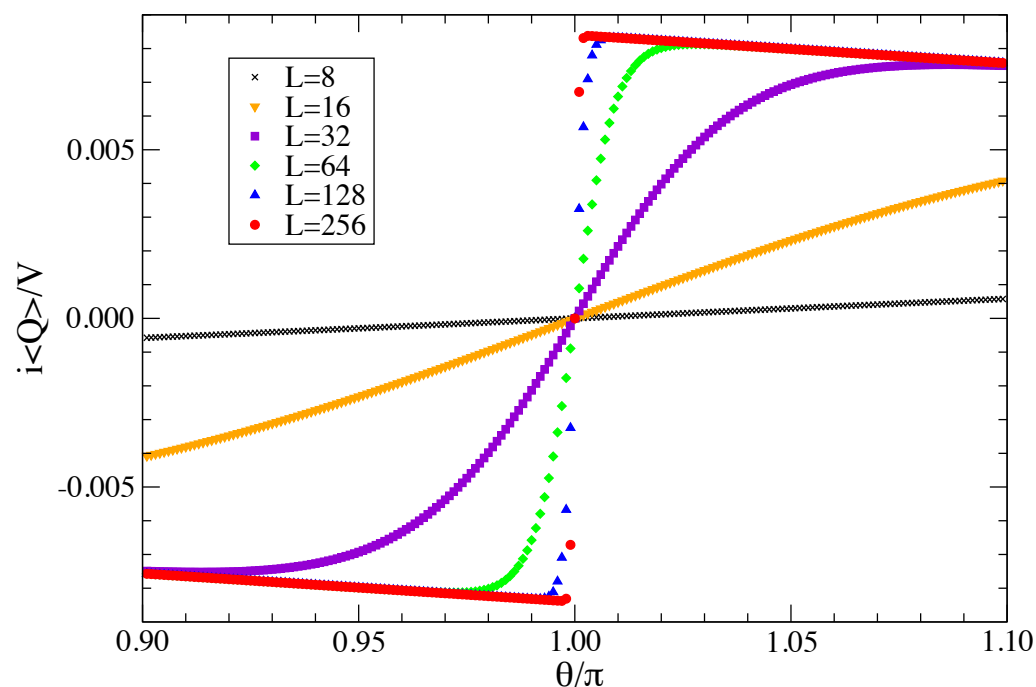
YK-Yoshimura, arXiv:1911.06480

Expectation value of topological charge (order parameter in this model)

$$\langle Q \rangle = -i \frac{\partial \ln Z}{\partial \theta}.$$

Numerical derivative in terms of  $\theta$

Volume dependence of topological charge density around  $\theta=\pi$



Finite gap is generated toward  $L \rightarrow \infty \Rightarrow$  1st order phase transition

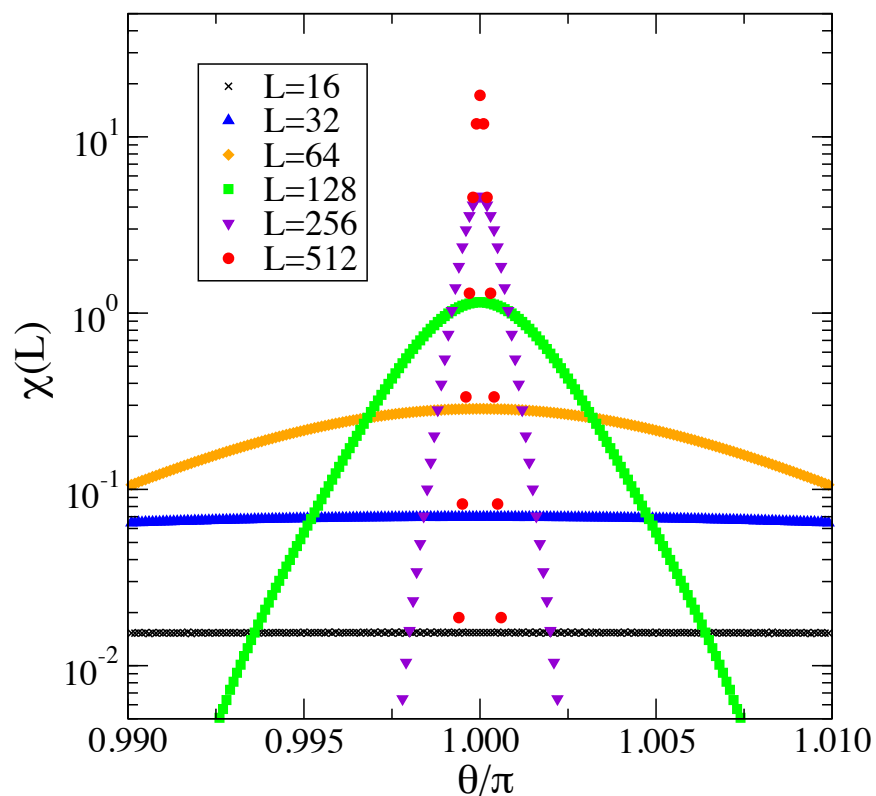


# Topological Susceptibility

YK-Yoshimura, arXiv:1911.06480

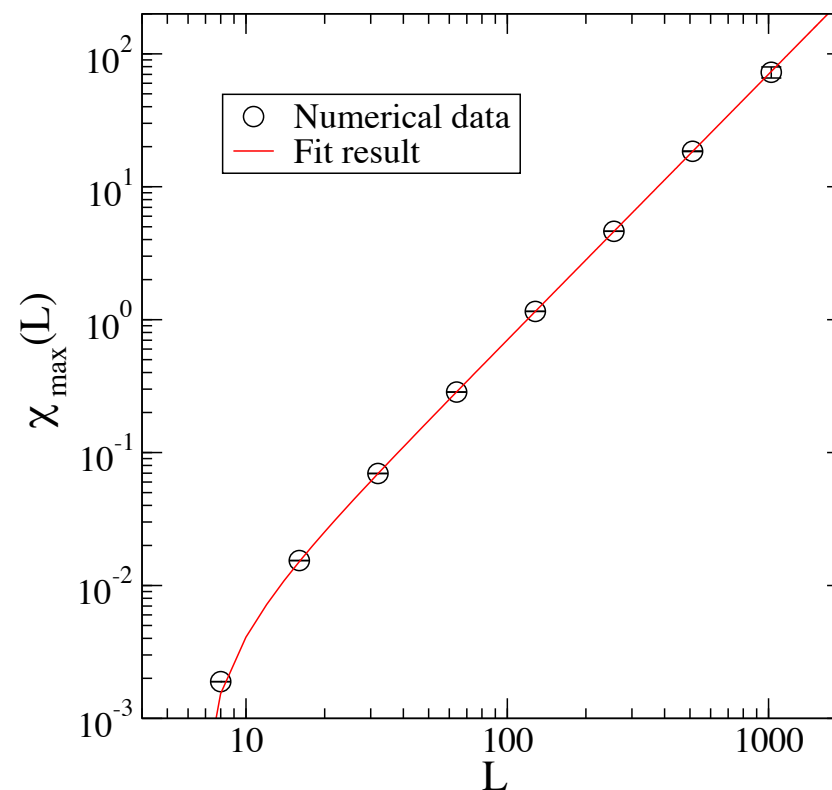
Topological susceptibility

$$\chi(L) = -\frac{1}{V} \frac{\partial^2 \ln Z}{\partial \theta^2}.$$



FSS of peak height

$$\chi_{\max}^*(L) = A + BL^{\gamma/\nu}$$



Critical exponent  $\gamma/\nu=1.998(2) \Rightarrow$  1st order phase transition



# Summary

## What we have achieved so far

- Application of TRG/HOTRG to 2D scalar, fermion and gauge theories
  - Construction of TN rep. for scalar field theories
  - Development of Grassmann TRG/HOTRG for fermion systems
  - **Successful analyses of 2D models w/ complex actions**
- Analyses of higher dimensional models
  - Phase transition of 3D  $Z_2$  gauge theory
  - Phase transition of 4D Ising model

## Next step

- Analysis of 3D, 4D models
  - Non-Abelian gauge theories