

Tensor renormalization group approach for lattice gauge theories

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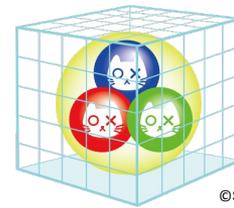
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2025.7.31 @ YITP

Recent Developments and Challenges in Tensor Networks:
Algorithms, Applications to science, and Rigorous theories

- I'm going to talk about the tensor renormalization group (TRG) approach and its application to the **high-energy physics**, particularly to the **lattice gauge theories (LGT)**
 - Traditionally, the LGT community has been working on the path integral formalism using the MC methods. The sign problem is inevitable, unfortunately
 - The community has been recently paying more attention to some alternative approaches, involving tensor networks and quantum computing
- A goal for the community is to investigate the **quantum chromodynamics (QCD)** using tensor networks, which will allow us to understand the QCD phase diagram at finite temperature and density
 - Two ways are available in tensor networks:
 - Working on the canonical quantization \Rightarrow **3D PEPS, TTN, ...**
 - Working on the path integral quantization \Rightarrow **4D TNR, TRG, ...**
 - Interdisciplinary efforts should be needed



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A quick look at the QCD

- The QCD describes the **strong interaction** btw quarks and gluons

Quarks = Grassmann fields

$$S = -\frac{1}{2} \sum_{n \in \Lambda_d} \sum_{\nu=1}^d \sum_{f=1}^{N_f} \left[e^{\mu \delta_{\nu,d}} \bar{\psi}^{(f)}(n) (\mathbb{1} - \gamma_{\nu}) U_{\nu}(n) \psi^{(f)}(n + \hat{\nu}) + e^{-\mu \delta_{\nu,d}} \bar{\psi}^{(f)}(n + \hat{\nu}) (\mathbb{1} + \gamma_{\nu}) U_{\nu}(n)^{\dagger} \psi^{(f)}(n) \right]$$

$$+ \sum_n \sum_f M^{(f)} \bar{\psi}^{(f)}(n) \psi^{(f)}(n)$$

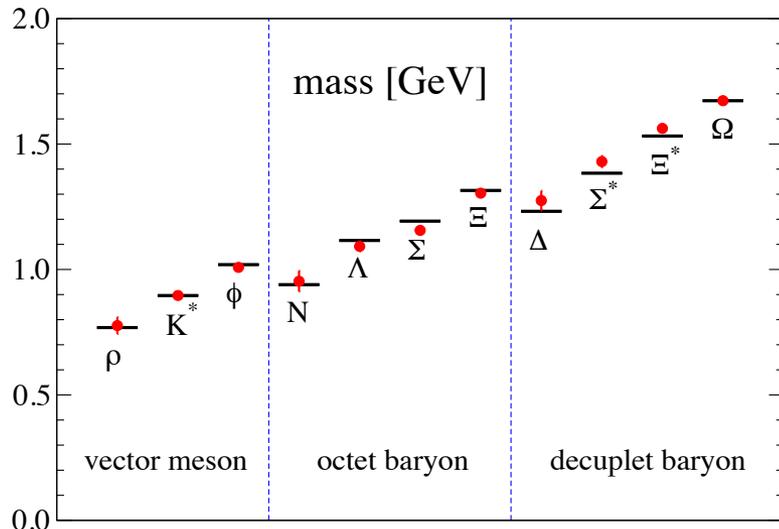
$$+ \frac{\beta}{N_c} \sum_n \sum_{\nu < \rho} \Re \text{Tr} \left[\mathbb{1} - U_{\nu}(n) U_{\rho}(n + \hat{\nu}) U_{\nu}(n + \hat{\rho})^{\dagger} U_{\rho}(n)^{\dagger} \right]$$

Gluons = SU(N_c) fields

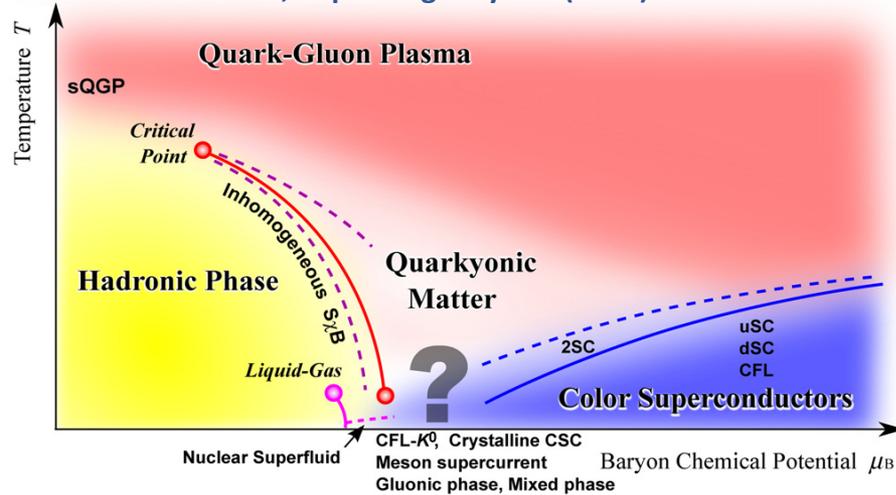
Dimensionality: d = 3+1
 # of flavors: N_f = 2+1(+1)
 # of colors: N_c = 3
 Quarks: 4 × N_f × N_c-component spinor
 Gluons: N_c × N_c matrix

μ ≠ 0 ⇒ the sign problem

PACS-CS Collaboration, Lattice2008



Fukushima-Hatsuda, Rept. Prog. Phys. 74(2011)014001



“Kogut’s sequence” toward QCD

- Can be a good roadmap
 - Gradually try to enlarge symmetry and to increase dimensionality
- Advantage of TN over MC
 - No sign problem
 - Can directly deal with **fermions**
 - Thermodynamic limit can be handled directly when the system has the translational symmetry
- What should be addressed
 - How can we regularize **bosons**?
 - Accuracy vs computational cost

II. LATTICE FIELD THEORY

A. The Kogut sequence: From Ising to QCD

In the early 1970s, QCD appeared to be a strong candidate for a theory of strong interactions involving quarks and gluons. However, the perturbative methods that provided satisfactory ways to handle the electroweak interactions of leptons failed to explain confinement, mass gaps, and chiral symmetry breaking. A nonperturbative definition of QCD was needed. In 1974, Wilson proposed ([Wilson, 1974](#)) a lattice formulation of QCD where the $SU(3)$ local symmetry is exact. As this four-dimensional model is fairly difficult to handle numerically, a certain number of research groups started considering simpler lattice models in lower dimensions and then increased symmetry and dimensionality. This led to a sequence of models, sometimes called the “Kogut ladder,” that appears in the reviews of [Kogut \(1979, 1983\)](#) and was later addressed with small modifications by [Polyakov \(1987\)](#) and [Itzykson and Drouffe \(1991\)](#).

The sequence is approximately the following:

- (1) $D = 2$ Ising model
- (2) $D = 3$ Ising model and its gauge dual
- (3) $D = 2$ $O(2)$ spin and Abelian Higgs models
- (4) $D = 2$ fermions and the Schwinger model
- (5) $D = 3$ and $4U(1)$ gauge theory
- (6) $D = 3$ and 4 non-Abelian gauge theories
- (7) $D = 4$ lattice fermions
- (8) $D = 4$ QCD

What is TRG?

Levin-Nave, PRL99 (2007) 120601
Cf. Talk by Naoki Kawashima on Jul. 30

- TRG is a variant of RSRG to approximately carry out tensor contractions
- What do we have to do within the TRG approach?
 - ① Derive a TN representation for the path integral we want to solve



- ② Carry out the tensor contractions employing a certain TRG algorithm



Pros and Cons

Cf. Talk by Naoki Kawashima on Jul. 30

- Several advantages:

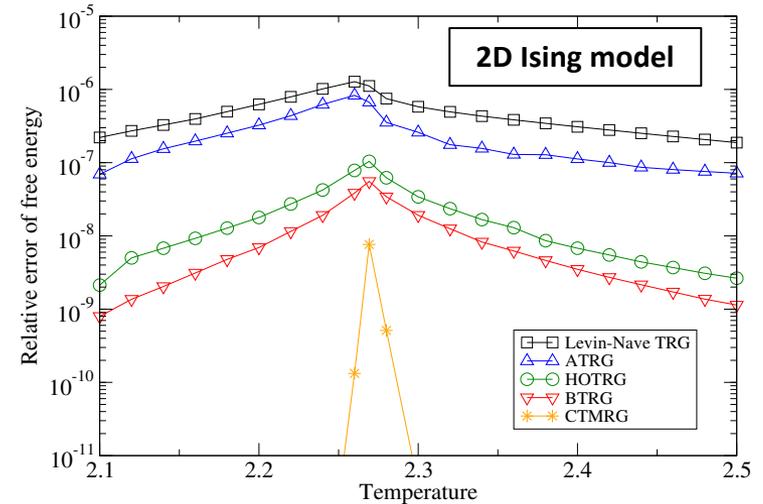
- No sign problem

- Thermodynamic limit

- Grassmann variables

- Path integral, Transfer matrix

- Higher-dimensional extension



- For the 2D TNs, there are much more efficient contraction algorithms available

Baxter, *J. Math. Phys.* 9 (1968) 650

Nishino, *J. Phys. Soc. Jpn*, 64 (1995) 3598-3601

Nishino-Okunishi, *J. Phys. Soc. Jpn*, 65 (1996) 891-894

- Corner Transfer Matrix RG (CTMRG)

G. Vidal, *PRL*91 (2003) 147902, *PRL*98 (2007) 070201

- infinite Time-Evolving Block Decimation

- Naïve TRG algorithms suffer from the **short-range correlation**

Cf. Evenbly-Vidal, *PRL*115 (2015) 180405, Yang+, *PRL*118 (2017) 110504, Hauru+, *PRB*97 (2018) 045111,

Harada, *PRB*97 (2018) 045125, Homma-Okubo-Kawashima, *PRR*6 (2024) 043102, ...

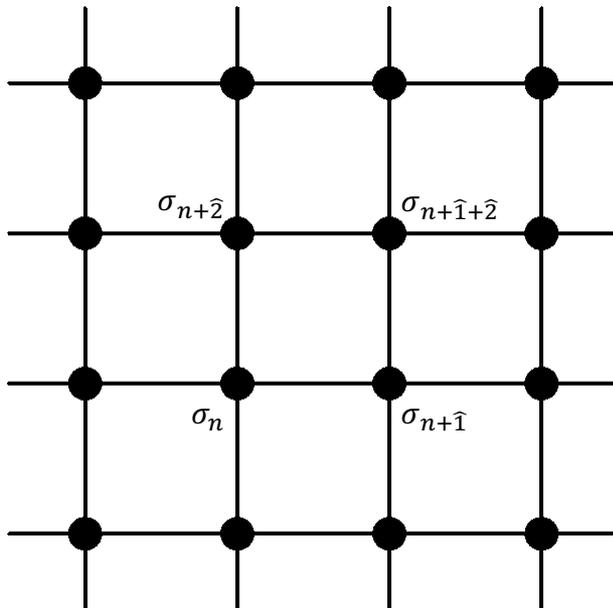
TN formulation of spin systems 1/2

- In the case of the nearest-neighbor interacting model on a square lattice

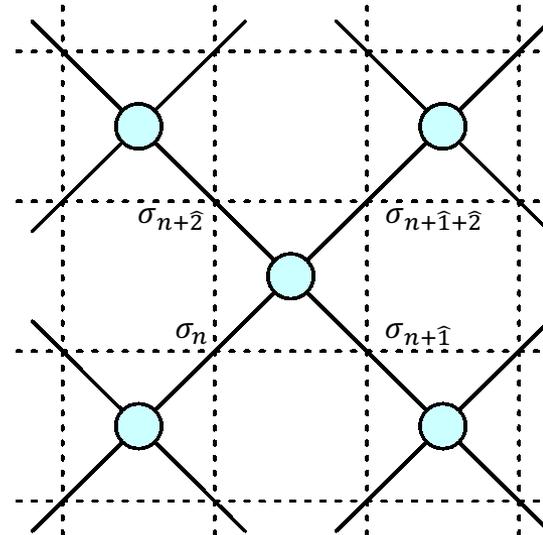
- $Z = \sum_{\{\sigma=\pm 1\}} \prod_{n,\mu} \exp[K\sigma_n\sigma_{n+\hat{\mu}}]$

- $Z = \sum_{\{\sigma=\pm 1\}} \prod T_{\sigma_n\sigma_{n+\hat{1}}\sigma_{n+\hat{2}}\sigma_{n+\hat{1}+\hat{2}}}$

- $T_{\sigma_n\sigma_{n+\hat{1}}\sigma_{n+\hat{2}}\sigma_{n+\hat{1}+\hat{2}}} := \exp[K(\sigma_n\sigma_{n+\hat{1}} + \sigma_{n+\hat{1}}\sigma_{n+\hat{1}+\hat{2}} + \sigma_{n+\hat{1}+\hat{2}}\sigma_{n+\hat{2}} + \sigma_{n+\hat{2}}\sigma_n)]$



Real Space



TN rep. of Z

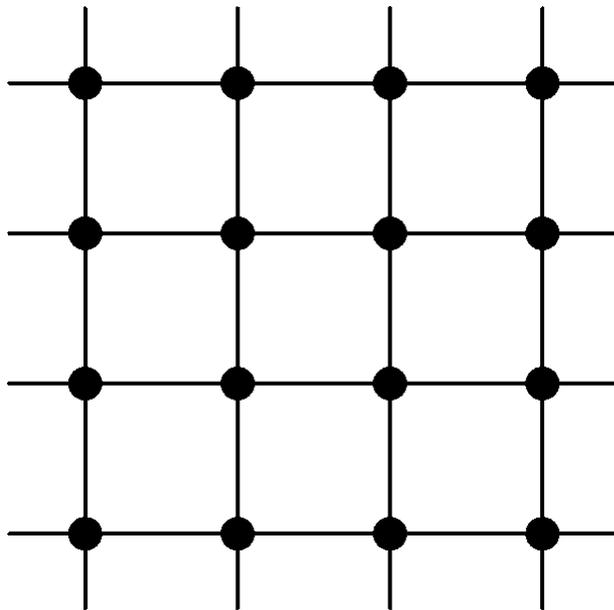
TN formulation of spin systems 2/2

- Another way to derive a TN rep. by integrating out original spin variables

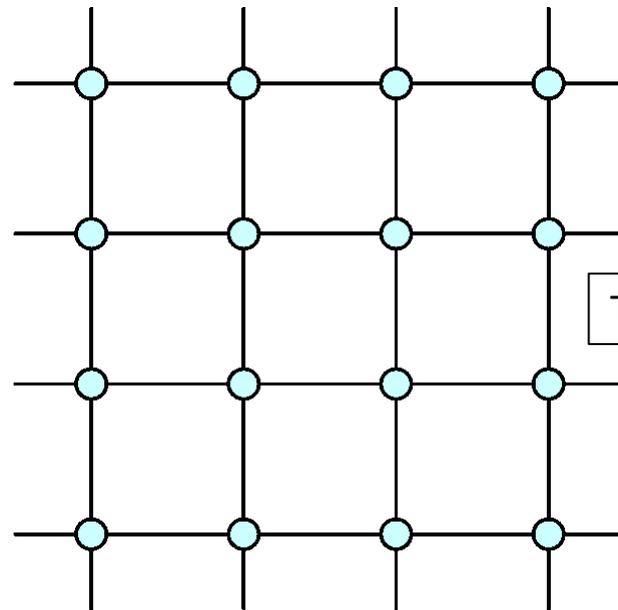
- $M_{\sigma_n \sigma_{n+\hat{\mu}}} := \exp[K \sigma_n \sigma_{n+\hat{\mu}}] = \sum_{\alpha} U_{\sigma_n \alpha} S_{\alpha} V_{\sigma_{n+\hat{\mu}} \alpha}^*$

- $(T_n)_{xyx'y'} := \sqrt{S_x S_y S_{x'} S_{y'}} \sum_{\sigma_n} U_{\sigma_n x} U_{\sigma_n y} V_{\sigma_n x'}^* V_{\sigma_n y'}^*$

- $Z = \text{tTr}[\prod_n T_n]$



Real Space



TN rep. of Z

TN formulation of gauge fields 1/2

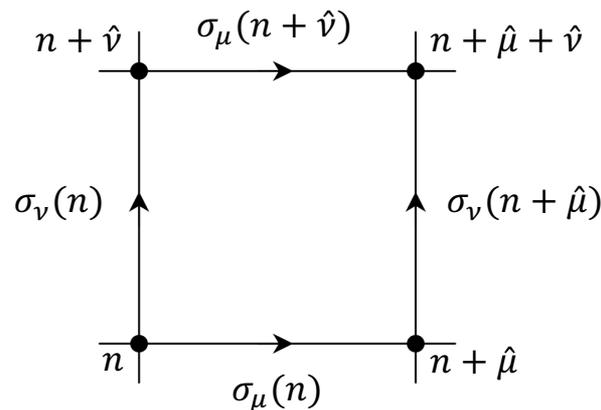
- Let us consider the Ising gauge theory on a square lattice

- $Z = \sum_{\{\sigma=\pm 1\}} \prod_{n,\mu>\nu} \exp[K \sigma_\mu(n) \sigma_\nu(n + \hat{\mu}) \sigma_\mu(n + \hat{\nu}) \sigma_\nu(n)]$

- $Z = \sum_{\{\sigma=\pm 1\}} \prod T_{\sigma_\nu(n+\hat{\mu}) \sigma_\mu(n+\hat{\nu}) \sigma_\nu(n) \sigma_\mu(n)}$

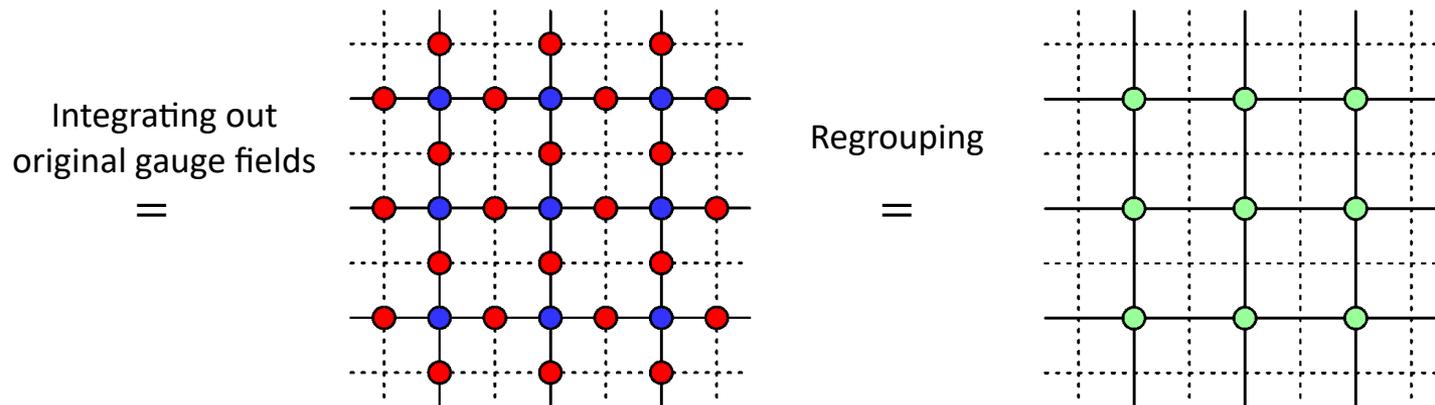
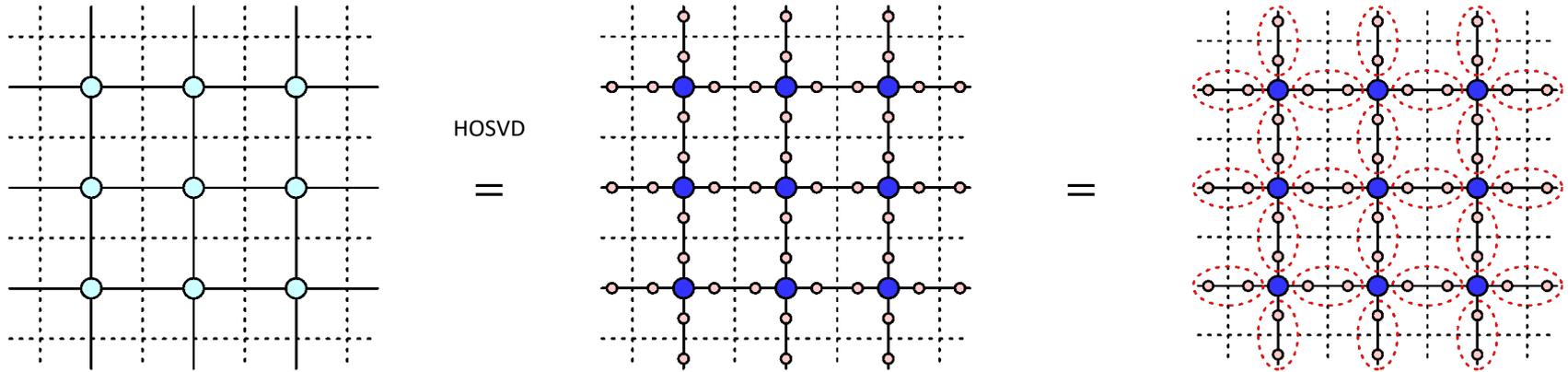
- $T_{\sigma_\nu(n+\hat{\mu}) \sigma_\mu(n+\hat{\nu}) \sigma_\nu(n) \sigma_\mu(n)} := \exp[K \sigma_\mu(n) \sigma_\nu(n + \hat{\mu}) \sigma_\mu(n + \hat{\nu}) \sigma_\nu(n)]$

Cf. Kuramashi-Yoshimura, JHEP04(2020)089



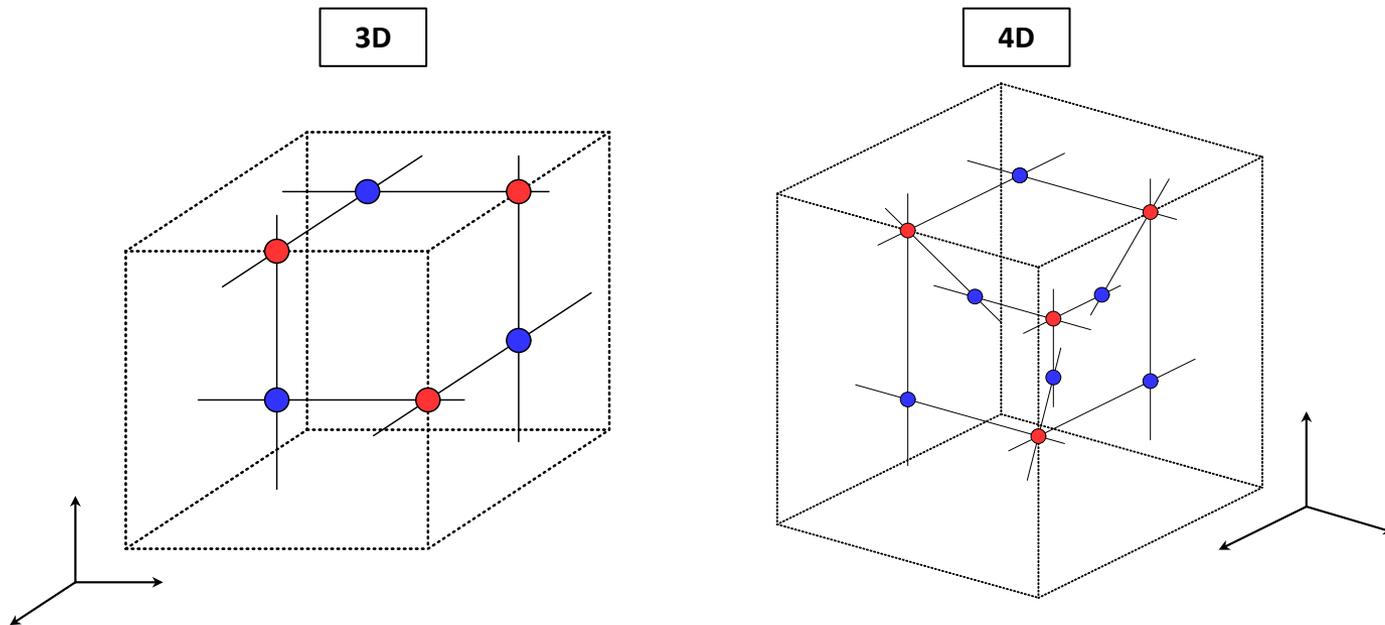
TN formulation of gauge fields 2/2

- One can move on to another TN rep. by integrating out original Ising gauge fields



TN formulation of higher-dimensional LGTs

- Fundamental tensors are available by integrating out the original gauge fields
- **Asymmetric formulation** [Liu+, PRD88\(2013\)056005](#)
- Another TN formulation without integrating out the original fields
- Plaquette gauge action \Leftrightarrow Can be regarded as local four-leg tensors



How about non-Abelian gauge theories?

- **Character expansion** [Liu+, PRD88\(2013\)056005](#), [Hirasawa+, JHEP12\(2021\)011](#)
 - Fourier transformation on a group manifold
- **Reduced TN formulation** [Yosprakob, PTEP2024\(2024\)073B05](#), [Yosprakob-Okunishi, PTEP2025\(2025\)033B06](#)
 - Removes redundancy from the initial TN rep.
- **Sampling method**
 - Tensor indices label the gauge field configurations
 - Random sampling [Fukuma-Kadoh-Matsumoto, PTEP2021\(2021\)123B03](#)
 - Trial action method [Kuwahara-Tsuchiya, PTEP2022\(2022\)093B02](#)
- **Numerical quadrature**
 - Replaces integrals by discretized summations [Luo-Kuramashi, PRD107\(2023\)094509](#)

Grassmann TN formulation for fermions

Gu-Verstraete-Wen, arXiv:1004.2563

- Path integrals involving the fermionic DoFs are defined as the Grassmann integrals

Gu, PRB88(2013)115139

$$\bullet \mathcal{J}_{\eta_1 \eta_2 \eta_3 \dots} = \sum_{i_1, i_2, i_3, \dots} T^{i_1 i_2 i_3 \dots} \eta_1^{i_1} \eta_2^{i_2} \eta_3^{i_3} \dots$$

Shimizu-Kuramashi, PRD90(2014)014508

Takeda-Yoshimura, PTEP2015(2015)043B01

Meurice, PoS LATTICE2018(2018)231

Bao's thesis, PhD, Uwaterloo

- A straightforward derivation of the GrassmannTN rep. for the fermionic path integral is available by introducing auxiliary Grassmann fields to decompose the hopping structure

SA-Kadoh, JHEP10(2021)188

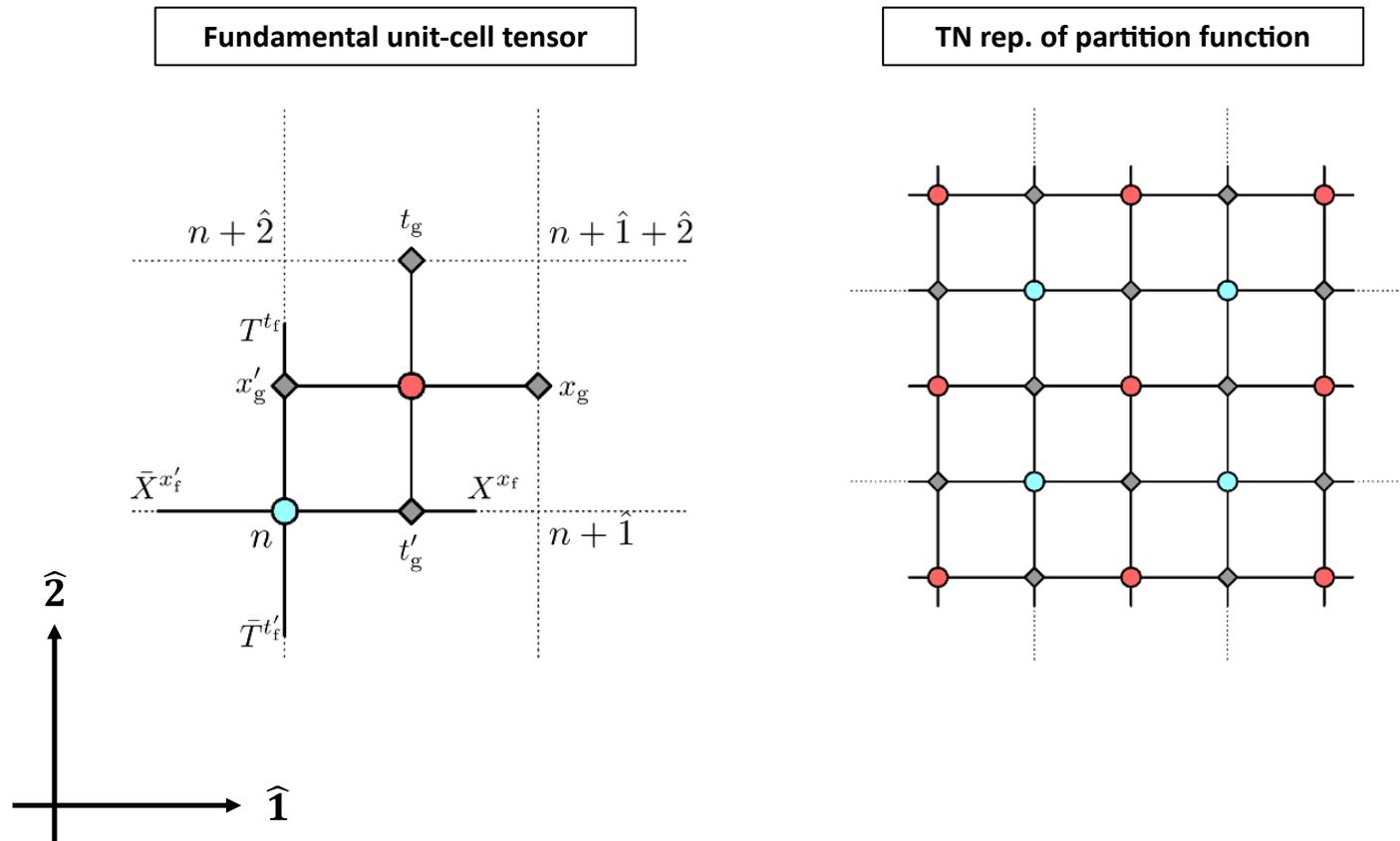
$$\bullet e^{A\bar{\psi}_n \psi_{n+\mu}} = \left(\int \int d\bar{\eta}_n d\eta_n e^{-\bar{\eta}_n \eta_n} \right) \exp\left[-\sqrt{A}\bar{\psi}_n \eta_n + \sqrt{A}\bar{\eta}_n \psi_{n+\mu}\right]$$

- Explicit correspondence btw TN and GrassmannTN

	Normal TN	Grassmann TN
Fundamental tensor	$(T_n)_{xyx'y'}$	$(\mathcal{J}_n)_{XY\bar{X}\bar{Y}}$
Contraction	$\sum_{\alpha} \dots$	$\int_{\bar{\theta}, \theta} \dots$
TN rep.	$\mathbf{tTr}[\prod_n T_n]$	$\mathbf{gTr}[\prod_n \mathcal{J}_n]$

TN formulation of LGTs w/ fermions

- Normal TN formulation for the gauge part and GrassmannTN formulation for the fermion part

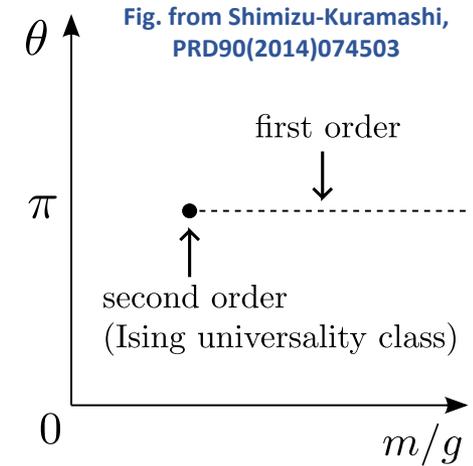
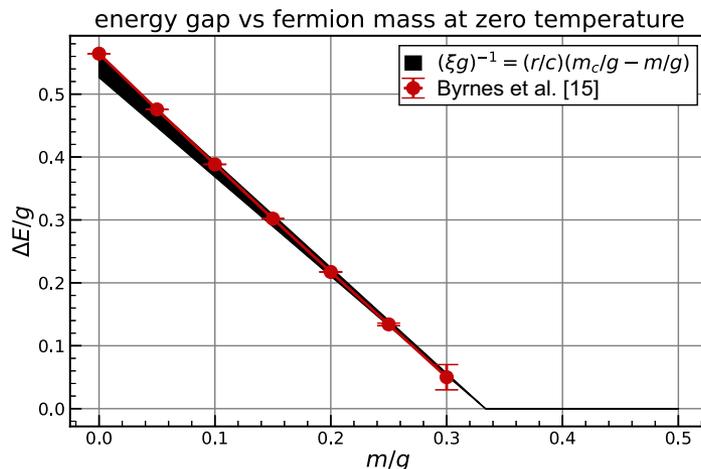


Schwinger model

- The most important QCD toy model in 2D
- Exactly solvable in the massless limit
- Mass perturbation, Bosonization [Coleman, Ann.Phys.101\(1976\)239](#)
- Various TN studies particularly for the model with a θ term

- “ $\theta \neq 0 \Rightarrow$ The sign problem”
- However, this sign problem can be avoided by the bosonization!

[Ohata, JHEP12\(2023\)007, PTEP2023\(2023\)013B02](#)



[Byrnes-Sriganesh-Bursill-Hamer, PRD66\(2002\)013002](#)

[Bañuls-Cichy-Jansen-Cirac, JHEP13\(2013\)158](#)

[Byrnes-Haegeman-Acoleyen-Verschelde-Verstraete, PRL113\(2014\)091601](#)

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

[Bañuls-Cichy-Cirac-Jansen-Kühn, PRL118\(2017\)071601](#)

[Pichler-Dalmonte-Rico-Zoller-Montangero, PRX6\(2016\)011023](#)

[Saito-Bañuls-Cichy-Cirac-Jansen, Lattice2014, Lattice2015](#)

[Zapp-Orús, PRD95\(2017\)114508](#)

[Magnifico-Vodola-Ercolessi-Kumar-Müller-Bermudez,](#)

[PRD99\(2019\)014503, PRB100\(2019\)115152](#)

[Funcke-Janse-Kühn, PRD101\(2020\)054507](#)

[Butt-Catterall-Meurice-Sakai-Unmuth-Yockey, PRD101\(2020\)094509](#)

[Honda-Itou-Tanizaki, JHEP11\(2022\)141](#)

[Angelides-Funcke-Janse-Küh, PRD108\(2023\)0145156](#)

[Dempsey-Klebanov-Benjamin-Søggard-Zan, PRL132\(2024\)031603](#)

[Yosprakob-Nishimura-Okunishi, JHEP11\(2023\)187](#)

[Itou-Matsumoto-Tanizaki, JHEP11\(2023\)231, JHEP09\(2024\)155](#)

[Kanno-SA-Murakami-Takeda, arXiv:2412.08959](#)

[Fujii-Fujikura-Kikukawa-Okuda-Pedersen, PRD111\(2025\)094505](#)

[Cruz-Tarnopolsky-Xin, arXiv:2412.01902](#)

Two-color QCD in two dimensions

Kwok Ho Pai-SA-Todo, JHEP03(2025)027, PoS(LATTICE2024)364

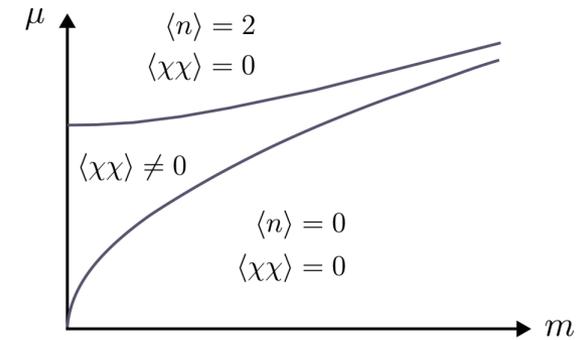
● 2D non-Abelian gauge theory is a non-trivial testbed for tensor networks

● $N_c=2$, **finite gauge coupling, dynamical fermions, finite density**

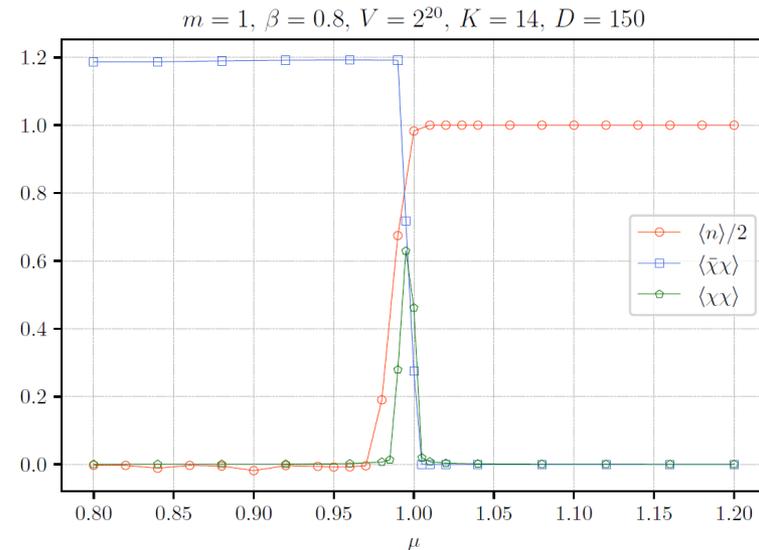
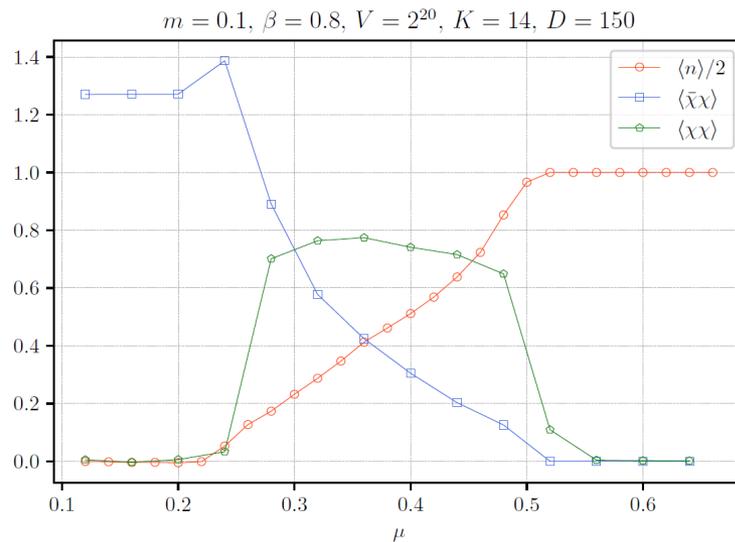
● The typical initial bond dimension is $\chi=4^{N_c} \times K$

● The DMRG study has been also reported recently

Hayata-Hidaka-Nishimura, JHEP07(2024)106

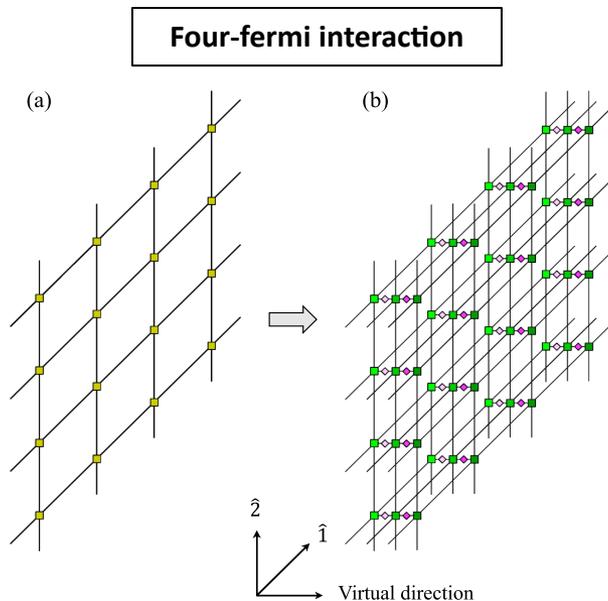


Nishida+, Phys. Rept. 398(2004)281-300

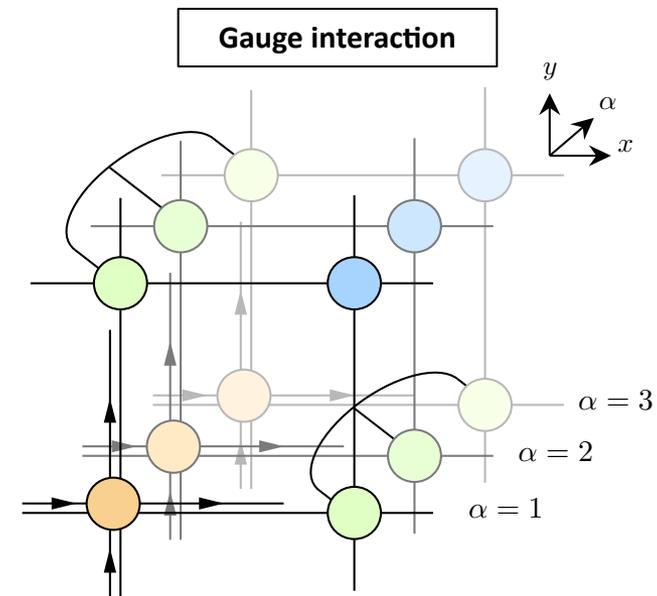


Multi-flavor theory

- Different flavor DoFs can be arranged in the virtual dimension direction
- Pseudo-site approach
- The bond dimension can be reduced **from $\chi_f^{N_f}$ to $N_f \times \chi_f$**
 - $\chi_f = 4^{N_c}$ in 2D Ho Pai-SA-Todo, JHEP03(2025)027, PoS(LATTICE2024)364, Cf. Asaduzzama+, JHEP05(2024)195
 - $\chi_f = 16^{N_c}$ w/ the 4D Wilson fermion



SA, PRD108(2023)034514



Yosprakob-Nishimura-Okunishi, JHEP11(2023)187

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Topical Review

Tensor renormalization group for fermions

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Abstract

We review the basic ideas of the tensor renormalization group method and show how they can be applied for lattice field theory models involving relativistic fermions and Grassmann variables in arbitrary dimensions. We discuss recent progress for entanglement filtering, loop optimization, bond-weighting techniques and matrix product decompositions for Grassmann tensor networks. The new methods are tested with two-dimensional Wilson–Majorana fermions and multi-flavor Gross–Neveu models. We show that the methods can also be applied to the fermionic Hubbard model in 1+1 and 2+1 dimensions.

Keywords: tensor networks, lattice gauge theory, relativistic lattice fermions, Fermi Hubbard model, Grassmann path integrals, sign problems

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Higher-dimensional TRG algorithms

- Real-space RG on tensor networks, whose accuracy can be systematically improved by increasing the bond dimension χ

- **Higher-Order TRG (HOTRG)**

Xie-Chen-Qin-Zhu-Yang-Xiang, PRB86(2012)045139

- Computationally demanding: $O(\chi^{4d-1})$

- **Anisotropic TRG (ATRG)** Adachi-Okubo-Todo, PRB102(2020)054432

- Less demanding than HOTRG: $O(\chi^{2d+1})$

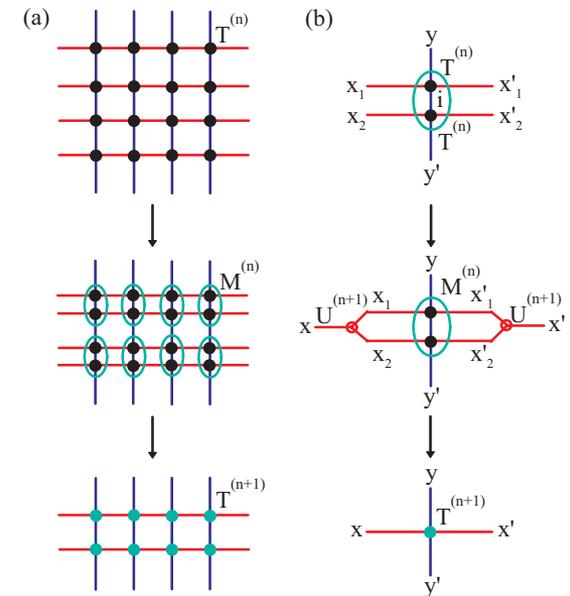
- **Triad TRG** Kadoh-Nakayama, arXiv:1912.02414

- Based on three-leg tensors: $O(\chi^{d+3})$

- **Minimally-Decomposed TRG** Nakayama, arXiv:2307.14191

- Comparable accuracy to HOTRG: $O(\chi^{2d+1})$

- **Triad ATRG** Sugimoto-Sasaki, PoS(LATTICE2024)038, arXiv:2507.21909
Cf. P28 by Yuto Sugimoto on Aug. 6



Xie+, PRB86(2012)045139

Anisotropic TRG

Adachi-Okubo-Todo, PRB102 (2020) 054432

● Decomposition of fundamental tensors

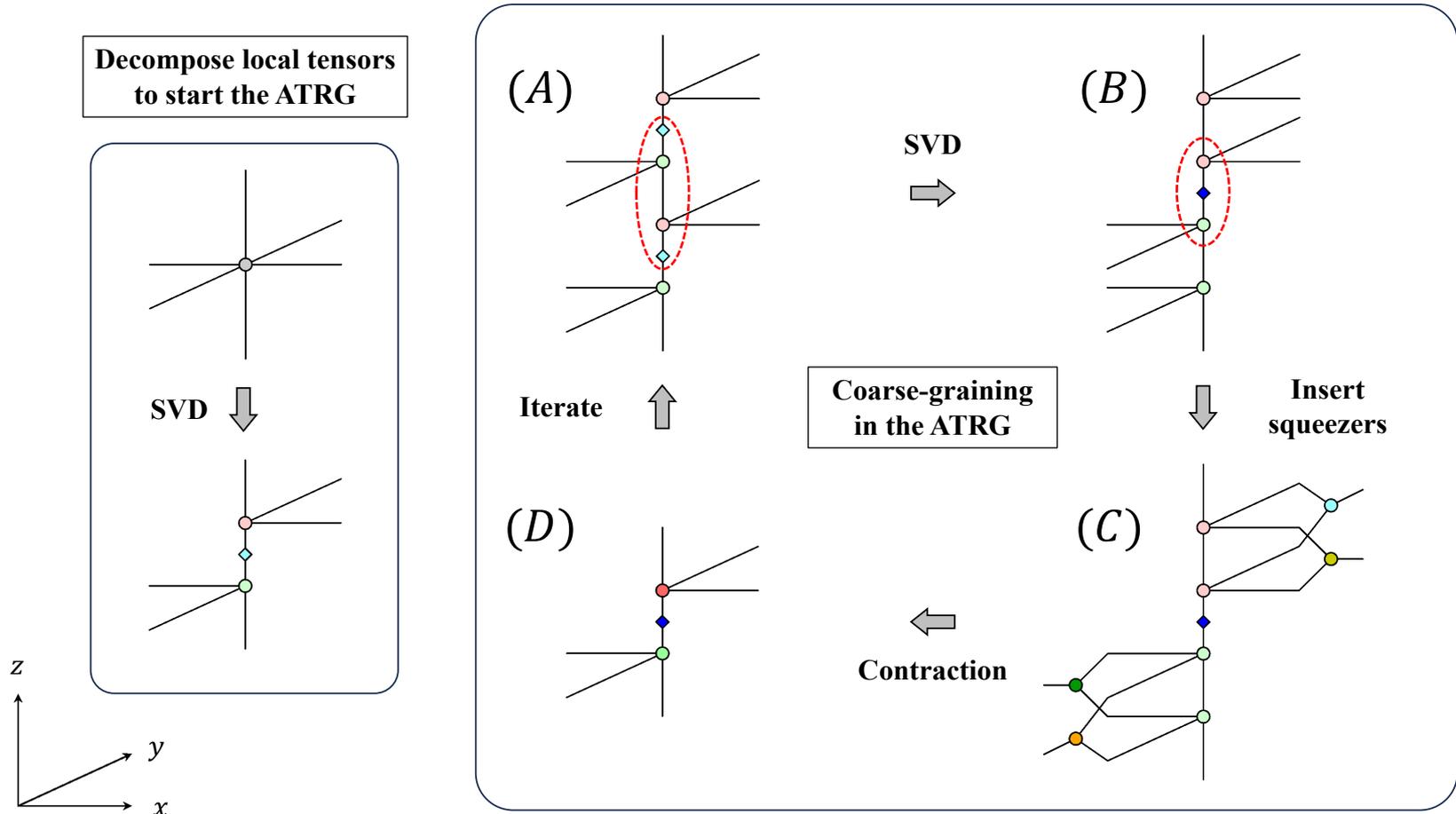
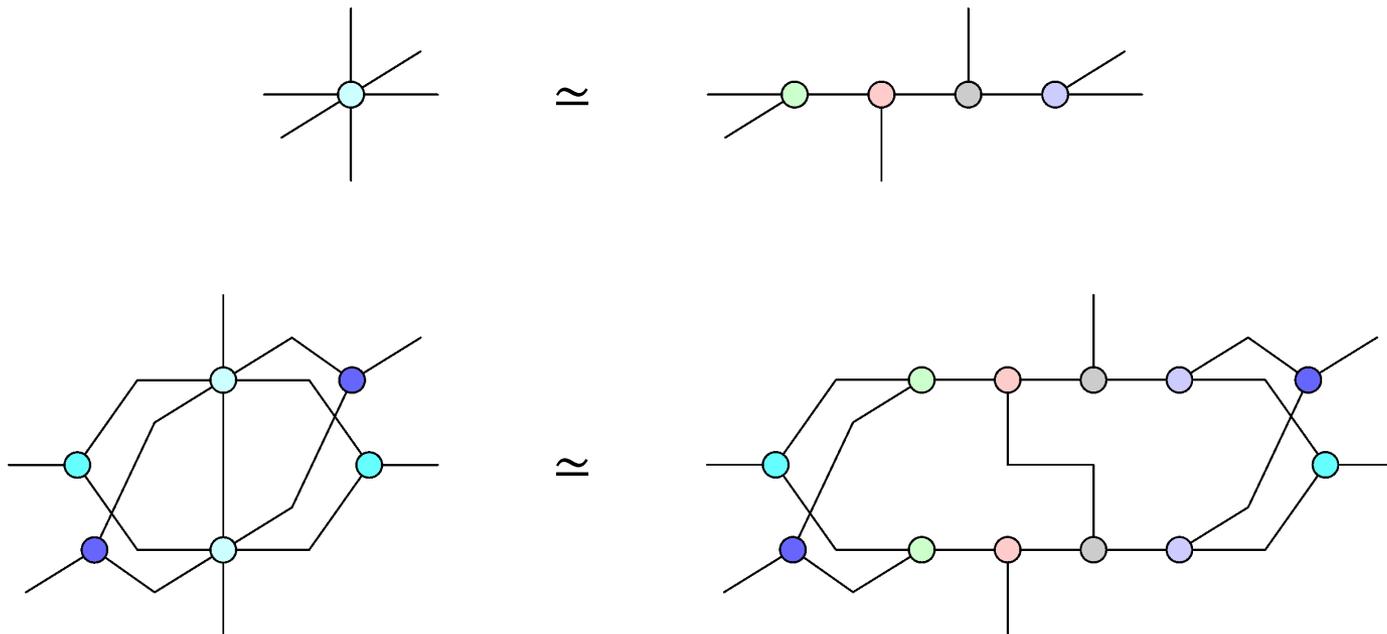


Figure is adapted from SA-Jha-Umuth-Yockey, PoS (LATTICE2023) 2024

Triad TRG

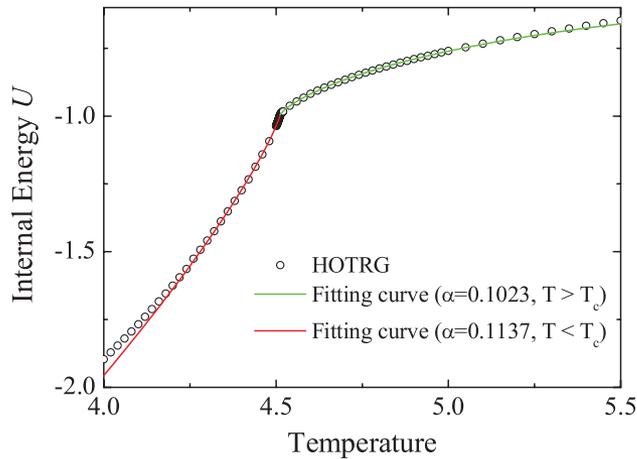
Kadoh-Nakayama, arXiv:1912.02414

- Further decomposition of fundamental tensors
- Triad TRG is based on the HOTRG recursion formula



Status in the (2+1)D systems

3D Ising model



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

Xie+, PRB86(2012)045139

Algorithm	Cost	Model
HOTRG Xie+, PRB86(2012)045139	$\chi^{4d-1} \ln L$	Ising Xie+ ★ Ising Lyu-Kawashima Potts model Wang+ free Wilson fermion Sakai+ Z_2 gauge theory Dittirich+, Kuramashi-Yoshimura U(1) gauge theory Unmuth-Yockey ★: w/ entanglement filtering
ATRG Adachi-Okubo-Todo, PRB102(2020)054432	$\chi^{2d+1} \ln L$	SU(2) LGT Kuwahara-Tsuchiya Real ϕ^4 theory SA+ Hubbard model SA-Kuramashi Z_2 gauge-Higgs model SA-Kuramashi SU(2) principal chiral model SA-Jha-Unmuth-Yockey
Triad RG Kadoh-Nakayama, arXiv:1912.02414	$\chi^{d+3} \ln L$	O(2) model Bloch+ Z_3 extended clock model Bloch+ Potts models Jha SU(2) principal chiral model SA-Jha-Unmuth-Yockey
MDTRG Nakayama, arXiv:2307.14191	$\chi^{2d+1} \ln L$	Complex ϕ^4 theory Aizawa+

The SU(2) principal chiral model on a cubic lattice

- Critical phenomena is in the O(4) universality class

Pisarski-Wilczek, PRD29(1984)338

Kanaya-Kaya, PRD51(1995)2402

Toussaint, PRD55(1997)362

Hasenbuch, JPA34(2001)8221

Engels+, PoS LAT2005(2006)148

Ejiri+, PRD80(2009)094505

- $S = -\frac{J}{2} \sum_{n,\nu} \text{Tr}[U(n)U(n + \hat{\nu})^\dagger]$

- Investigation of the truncation effect in the **character expansion**

$$\exp \left[\frac{J}{2} \text{Tr}[U(n)U(n + \hat{\nu})^\dagger] \right] \simeq \sum_{r=0}^{r_{\max}} F_r(J) \chi_r(U(n)U(n + \hat{\nu})^\dagger)$$

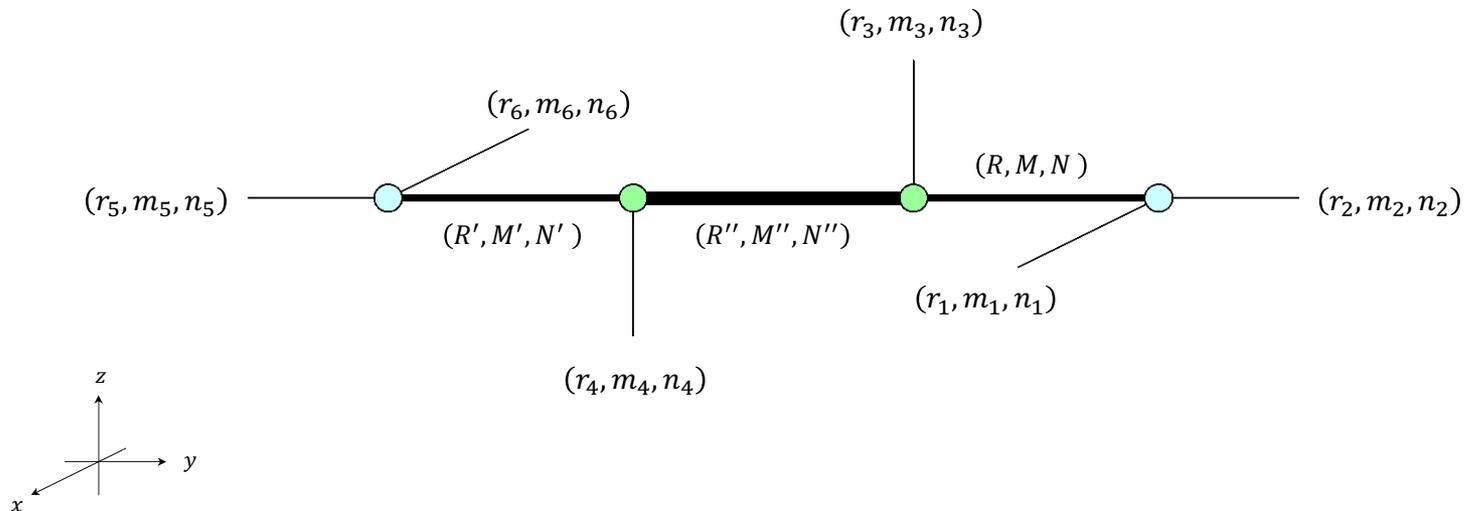
- SU(2) symmetry is preserved even after the truncation
- **O(4) universality should be observed even with the finite cutoff**
- Comparison of TRG algorithms beyond the Ising model
 - Triad TRG and Anisotropic TRG

Cf. TRG studies of the 2D model
Luo-Kuramashi, PRD107(2023)094509

The TN formulation

Liu+, PRD88(2013)056005

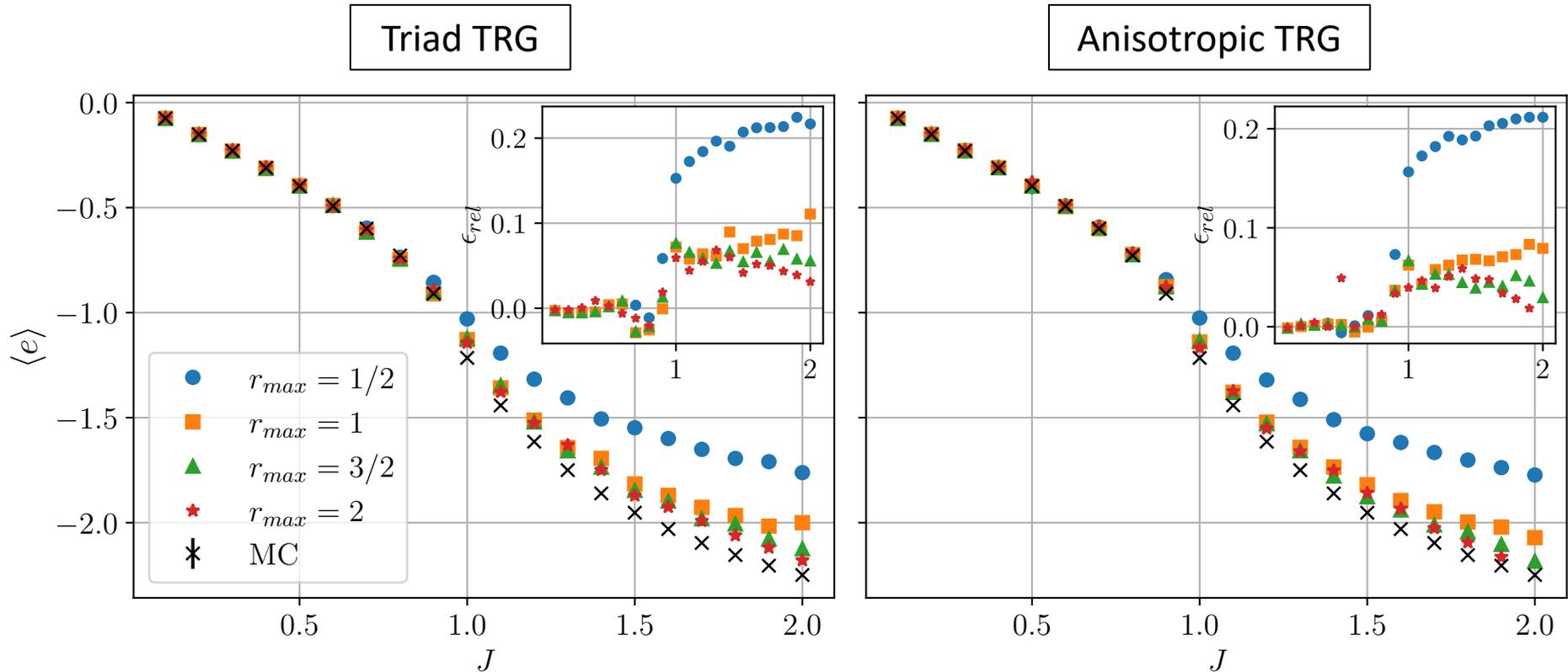
- Character expansion immediately gives us the triad representation
- **Network of the CG coefficients**
- Fundamental tensor at each site is as follows
- Path integral is restored by contracting these six-leg tensors



The internal energy

SA-Jha-Unmuth-Yockey, PRD110(2024)034519

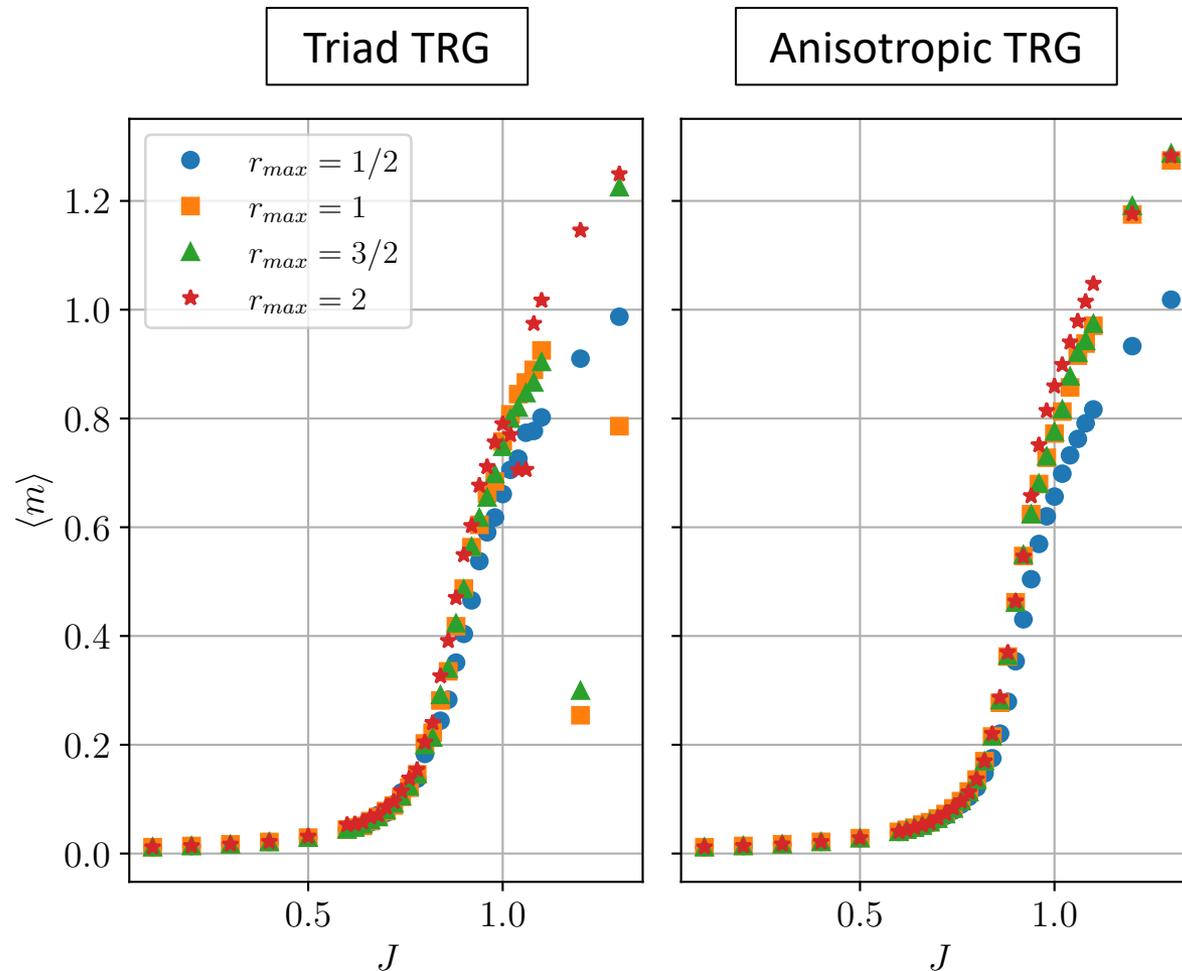
- Faster convergence in the strong-coupling regime



The magnetization

SA-Jha-Unmuth-Yockey, PRD110(2024)034519

- The magnetization is available, introducing a finite external field



O(4) scaling collapse

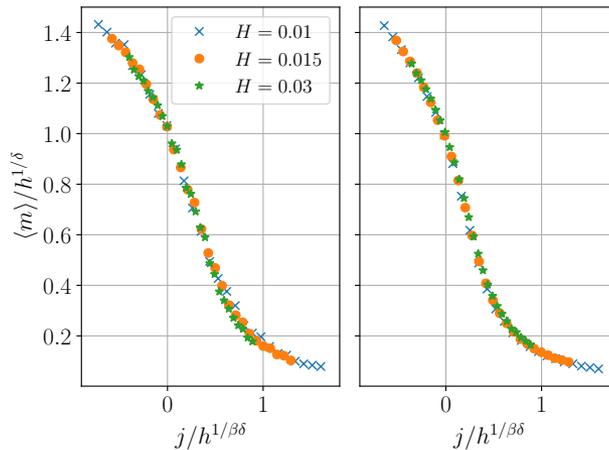
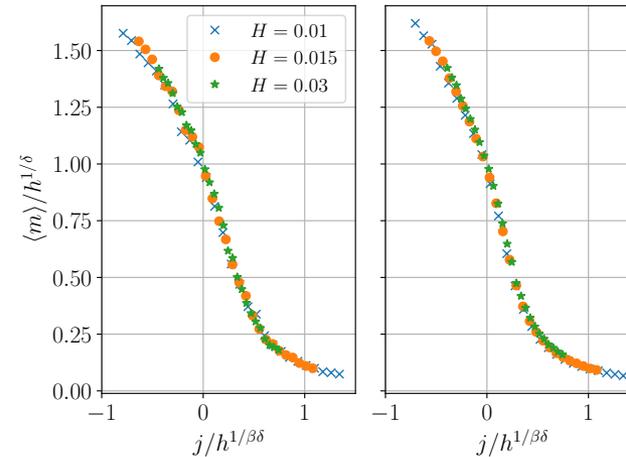
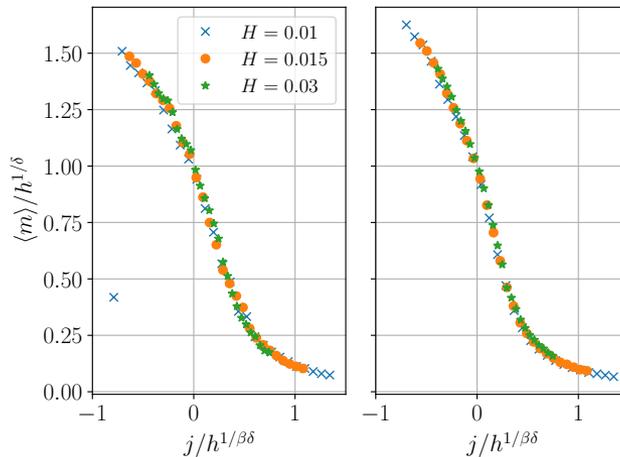
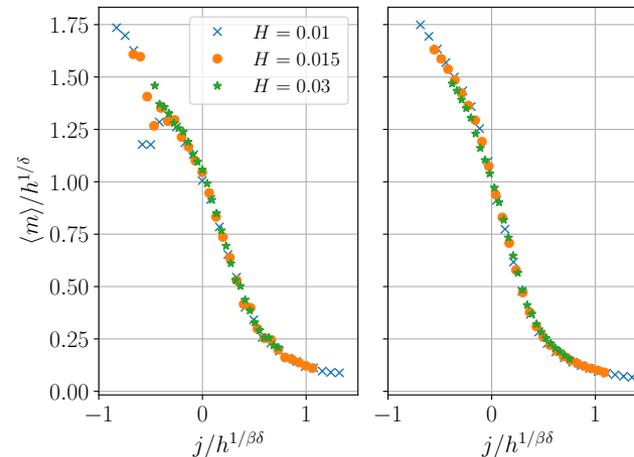
SA-Jha-Unmuth-Yockey, PRD110(2024)034519

● $\langle m \rangle h^{-\frac{1}{\delta}} = f(j/h^{1/\beta\delta})$ with $\beta = 0.3836$ and $\delta = 4.851$

Cf. Kanaya-Kaya, PRD51(1995)2402

Toussaint, PRD55(1997)362

● O(4) universality holds even with the finite cutoff


 $r_{max} = 1/2$

 $r_{max} = 1$

 $r_{max} = 3/2$

 $r_{max} = 2$

Status of TNs in the (3+1)D systems

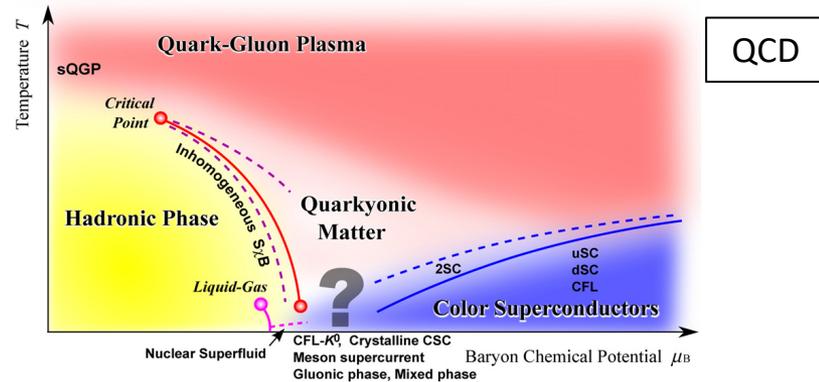
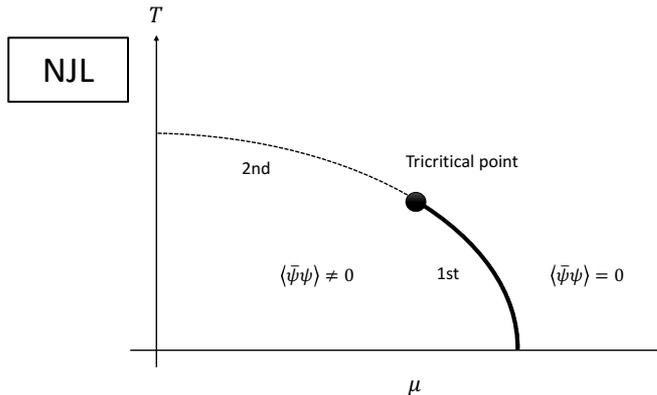
- More applications have been made by the TRG approach
 - Designing parallel computing methods for individual algorithms [SA+, PoS\(LATTICE2019\)138](#)
[Yamashita-Sakurai, CPC278\(2022\)108423](#)
 - Application of the machine learning techniques [Liao+, PRX9\(2019\)031041](#)
 - GPU acceleration [Jha-Samlodia, CPC\(2023\)108941](#), [Sugimoto-Sasaki, PoS\(LATTICE2024\)038](#)

Variational approach	TRG approach
<ul style="list-style-type: none"> • QED at finite density[★] Magnifico+ (2021) 	<ul style="list-style-type: none"> • Ising model SA+ (2019), Sugimoto-Sasaki (2024) • Staggered fermion w/ strongly coupled U(N) Milde+ (2022) • Complex ϕ^4 theory[★] SA+ (2020) • Nambu—Jona-Lasinio model[★] SA+ (2021) • Real ϕ^4 theory SA+ (2021) • Z_2 & Z_3 gauge-Higgs[★] SA-Kuramashi (2022, 2023)

★ : system w/ the sign problem

The cold-dense NJL model

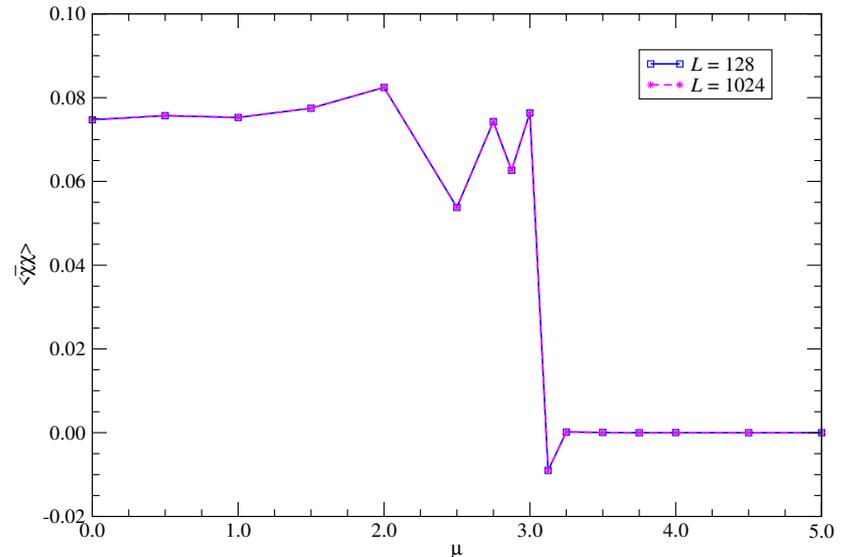
- NJL model at finite density is an effective theory of the QCD at finite density



Fukushima-Hatsuda, Rept. Prog. Phys. 74(2011)014001

- TRG has confirmed that the chiral symmetry is restored in the cold dense regime, where the MC is hindered by the severe sign problem

- Pressure and number density have also been obtained [SA+, JHEP01\(2021\)121](#)



Z_n gauge-Higgs model

- The simplest lattice gauge theory coupling to a matter field

$$S = -\beta \sum_n \sum_{\nu > \rho} \text{Re}[U_\nu(n) U_\rho(n + \hat{\nu}) U_\nu^*(n + \hat{\rho}) U_\rho^*(n)] \\ -\eta \sum_n \sum_\nu [e^{\mu\delta_{\nu,d}} \sigma^*(n) U_\nu(n) \sigma(n + \hat{\nu}) + e^{-\mu\delta_{\nu,d}} \sigma^*(n) U_\nu^*(n - \hat{\nu}) \sigma(n - \hat{\nu})]$$

- LGT's path integral measure is always defined as the Haar measure

- Unitary gauge fixing: $\sigma^*(n) U_\nu(n) \sigma(n + \hat{\nu}) \mapsto U_\nu(n)$

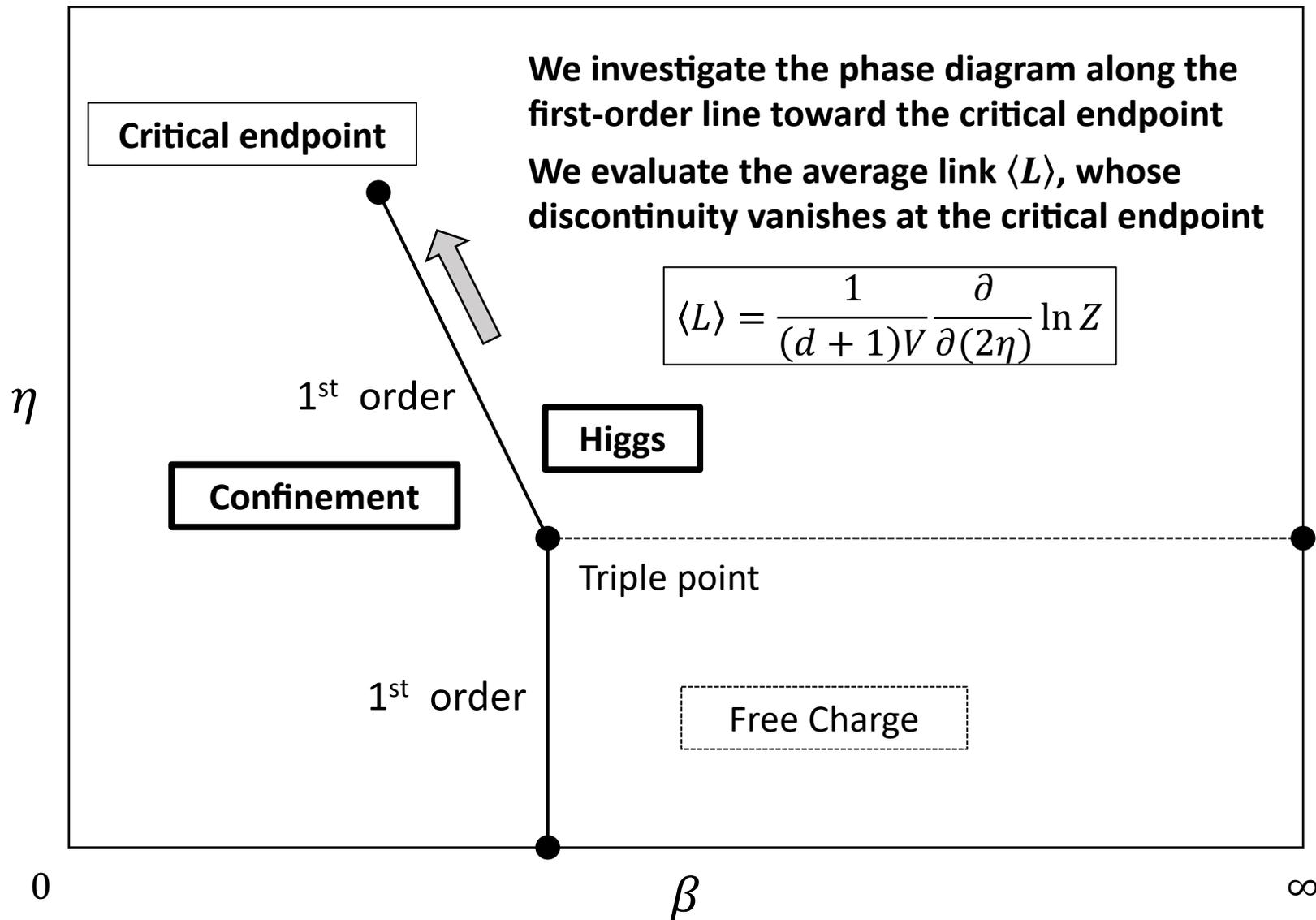
$$S = -\beta \sum_n \sum_{\nu > \rho} \text{Re}[U_\nu(n) U_\rho(n + \hat{\nu}) U_\nu^*(n + \hat{\rho}) U_\rho^*(n)] \\ -2\eta \sum_n \sum_\nu [\cosh(\mu\delta_{\nu,4}) \text{Re}U_\nu(n) + i \sinh(\mu\delta_{\nu,4}) \text{Im}U_\nu(n)]$$

- **Although the model looks quite simply, the reliable MC simulation is not always available**

- The sign problem takes place when $n=3$ and $\mu \neq 0$

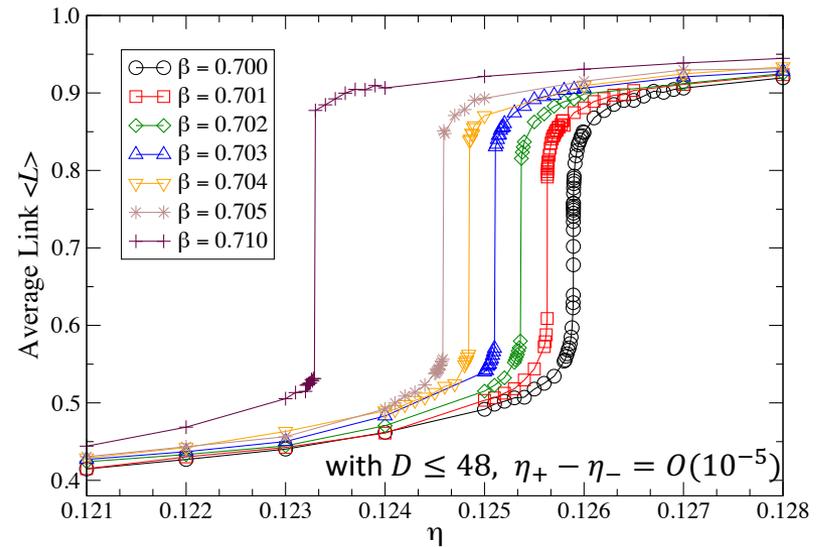
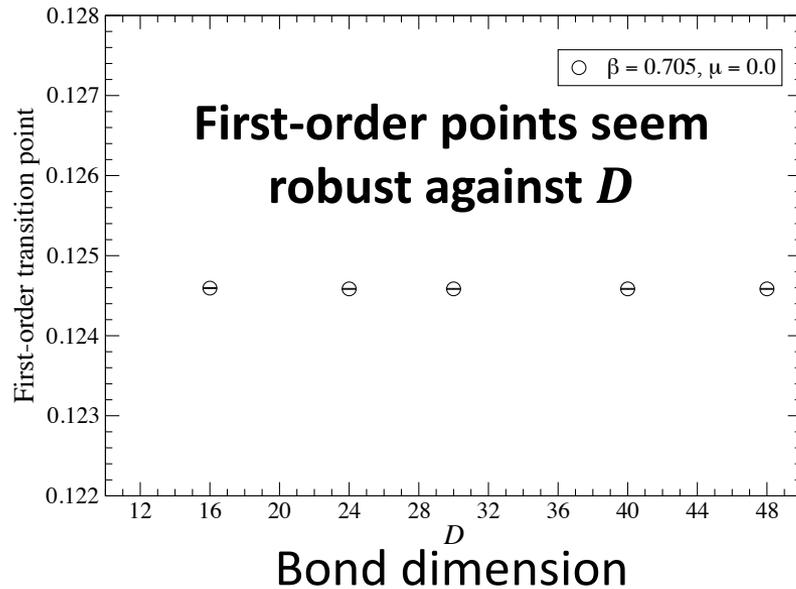
Cf. TRG studies of gauge-Higgs models in 2D
 Unmuth–Yockey+, PRD98(2018)094511
 Bazavov+, PRD99(2019)114507
 Butt+, PRD101(2020)094509

Phase diagram of the (3+1)D model at $\mu = 0$

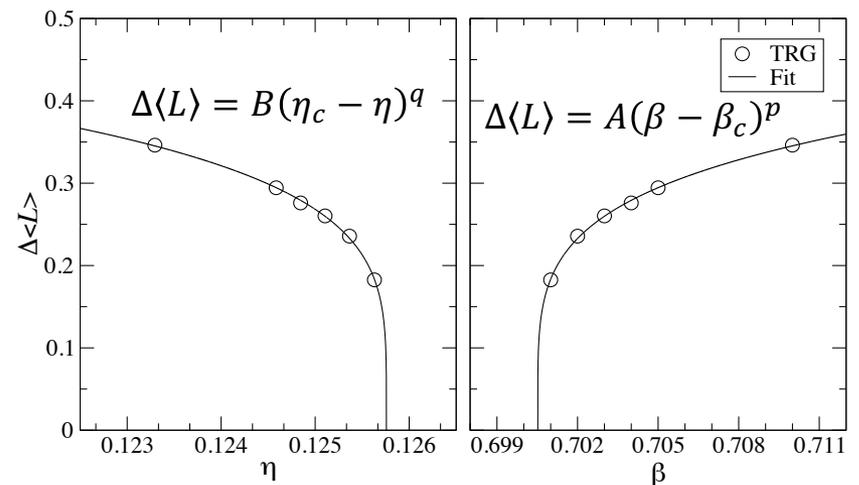


The (2+1)D model at $\mu = 0$

SA-Kuramashi, JHEP05(2022)102



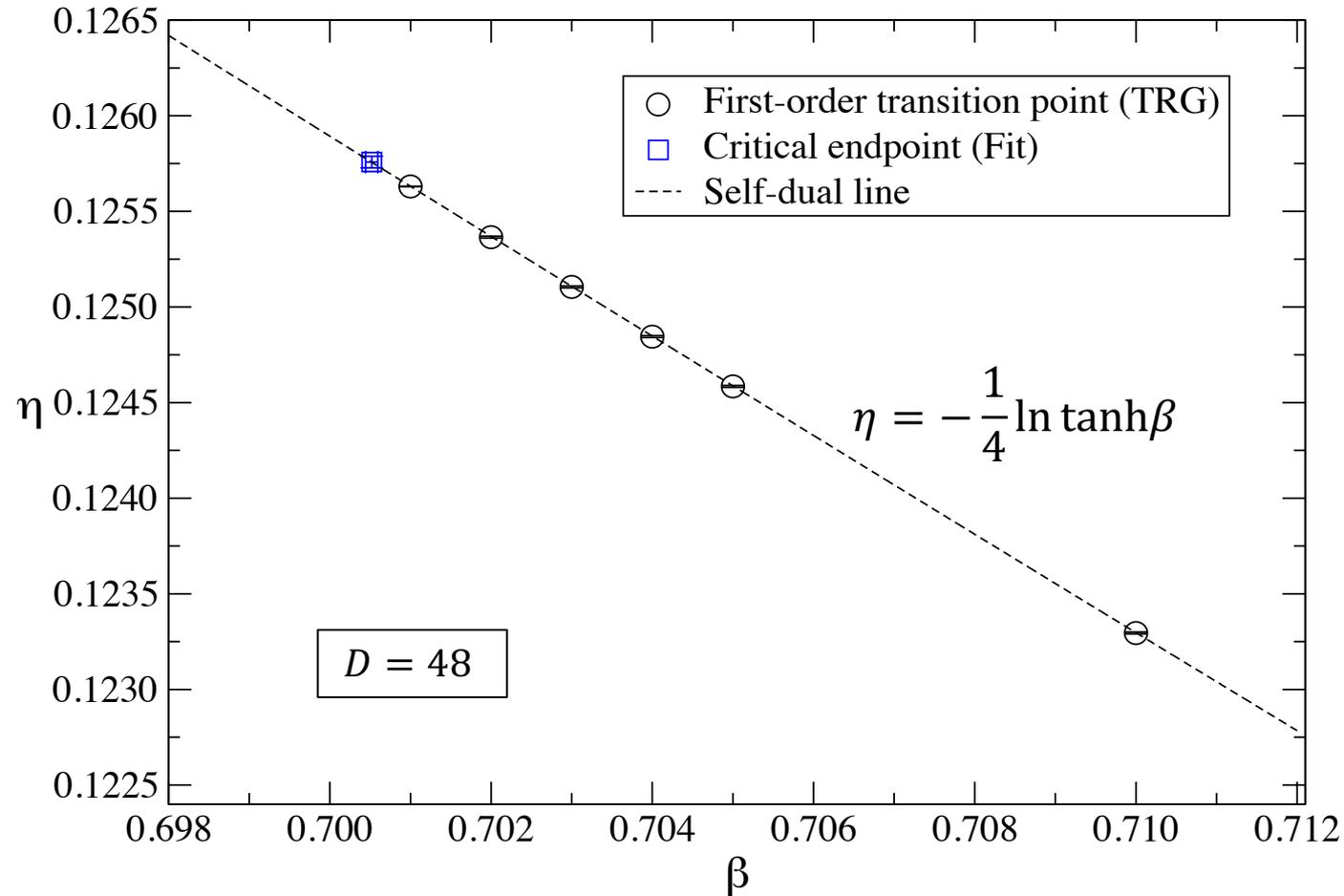
MC Somoza+, PRX11(2021)041008	$\beta_c \approx 0.701$
TRG this work	$\beta_c = 0.70051(7)$



Comparison with the self-dual line

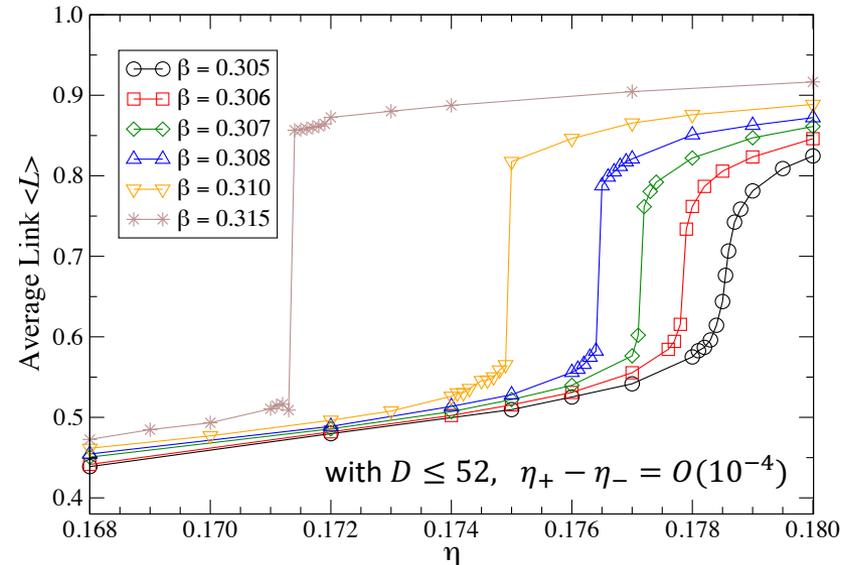
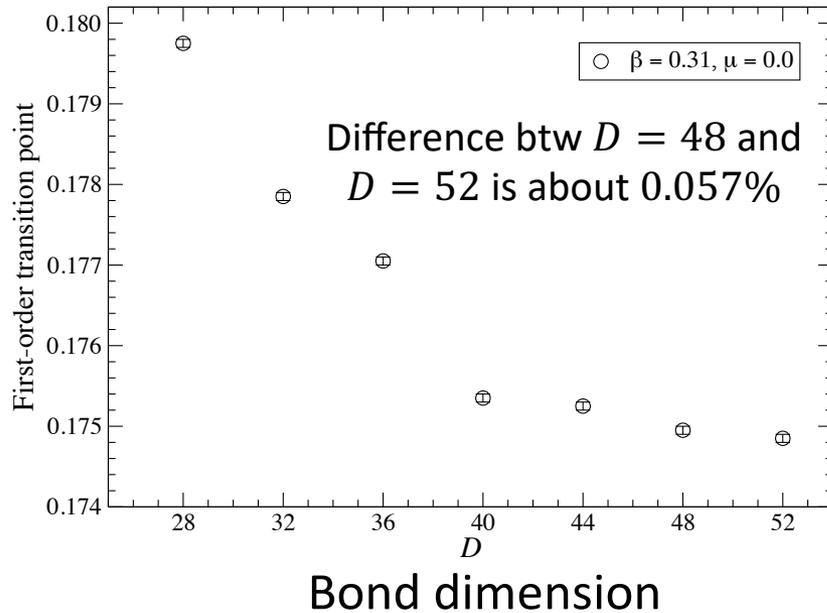
SA-Kuramashi, JHEP05(2022)102

- All transition points are precisely located on the self-dual line

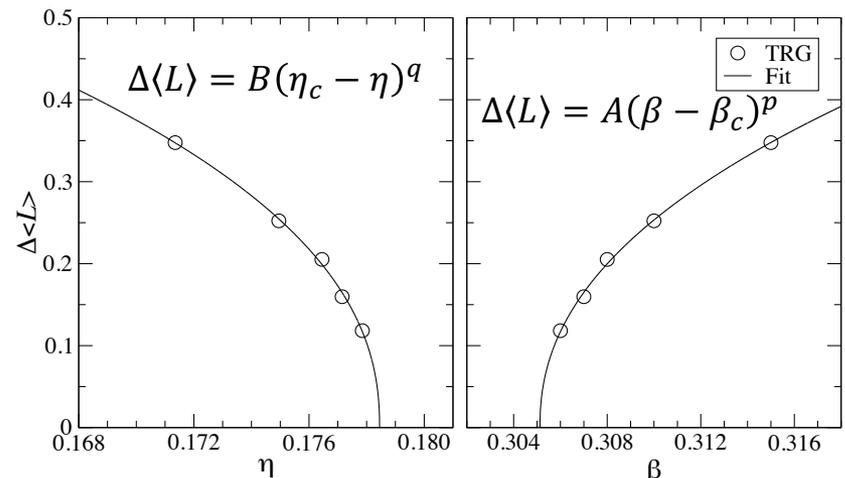


The (3+1)D model at vanishing density

SA-Kuramashi, JHEP05(2022)102



Mean-field Brezin-Drouffe, NPB200(1982)93	$(\beta_c, \eta_c) = (0.22, 0.205)$
MC on $V = 8^4$ Creutz, PRD21(1980)1006	(β_c, η_c) $= (0.22(3), 0.24(2))$
TRG w/ $D = 52$ this work	(β_c, η_c) $= (0.3051(2), 0.1784(2))$



The (3+1)D Z_3 model at vanishing density 1/2

SA-Kuramashi, JHEP10(2023)077

- Comparison btw MC and TRG via the average plaquette $\langle U \rangle$ and its susceptibility

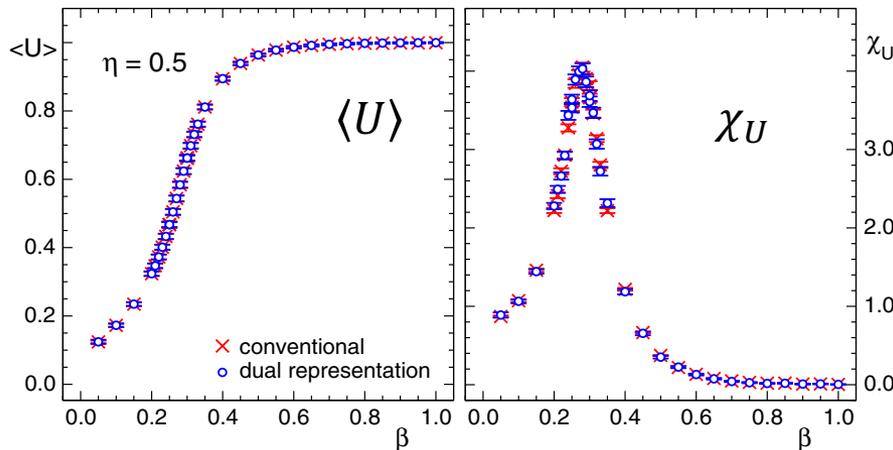
- Good agreement just w/ $D = 45$ at finite- η regime

$$\langle U \rangle = -\frac{1}{6V} \frac{\partial}{\partial \beta} \ln Z$$

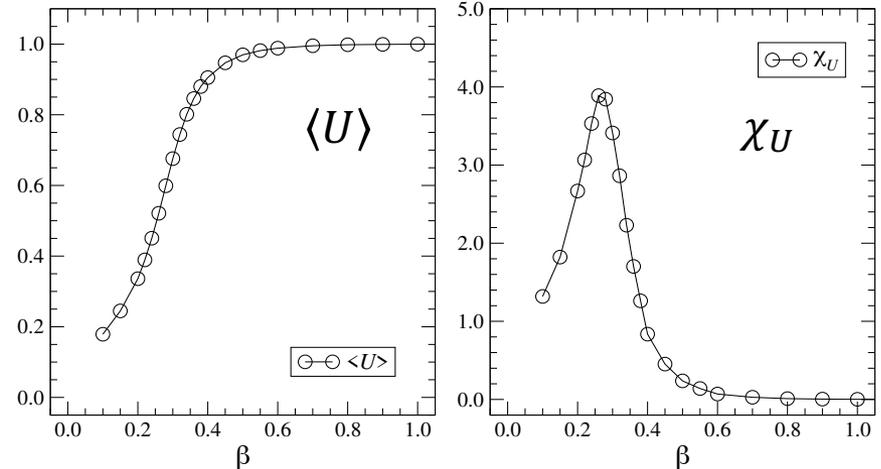
- The susceptibility of $\langle U \rangle$ is obtained by numerical difference in case of TRG

Monte Carlo

Gattringer-Schmidt, PRD86(2012)094506



TRG w/ $D = 45$



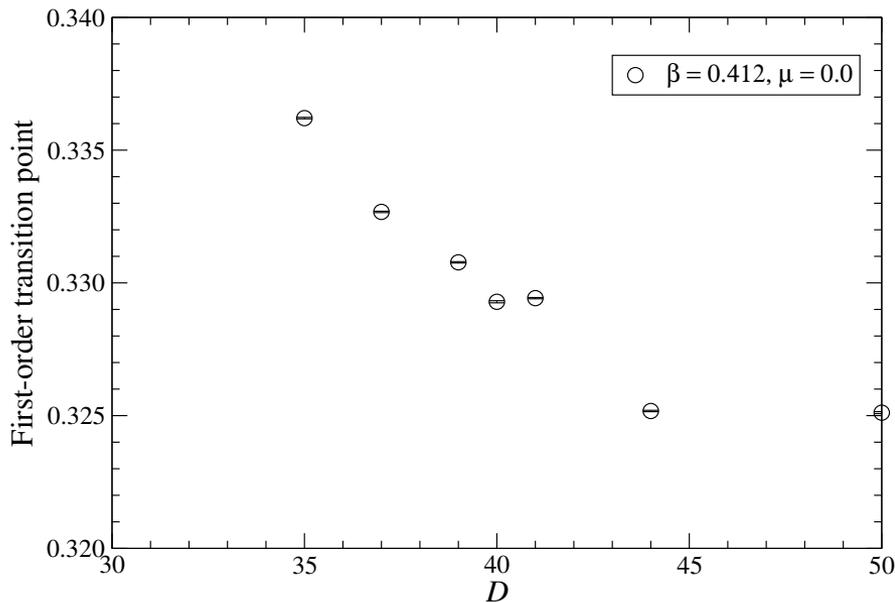
$\eta = 0.5, \mu = 0$

The (3+1)D Z_3 model at vanishing density 2/2

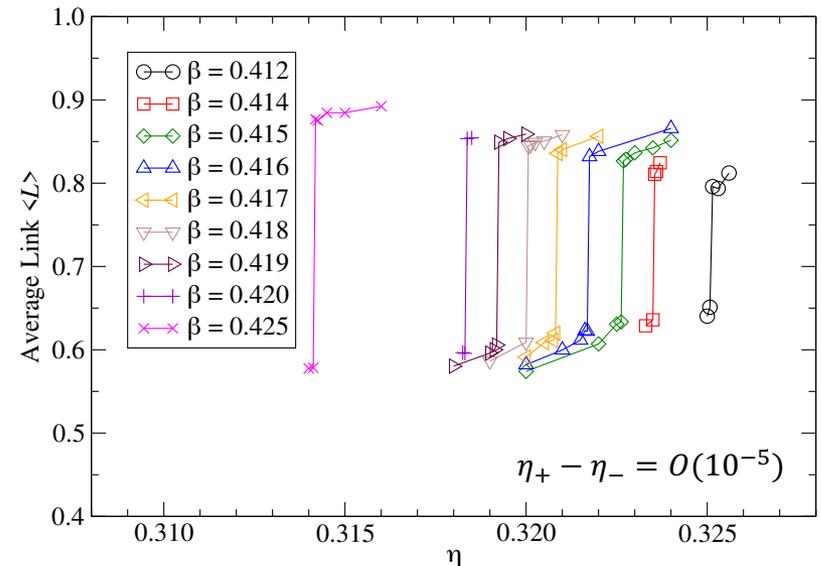
SA-Kuramashi, JHEP10(2023)077

- Location of the transition point seems converging w.r.t the bond dim.
- Relative error btw $D = 44$ and $D = 50$ is **0.019%**
- $\Delta\langle L \rangle$ becomes smaller when β becomes smaller, as expected

D -dependence in the first-order transition point



Average link@ $D = 50$

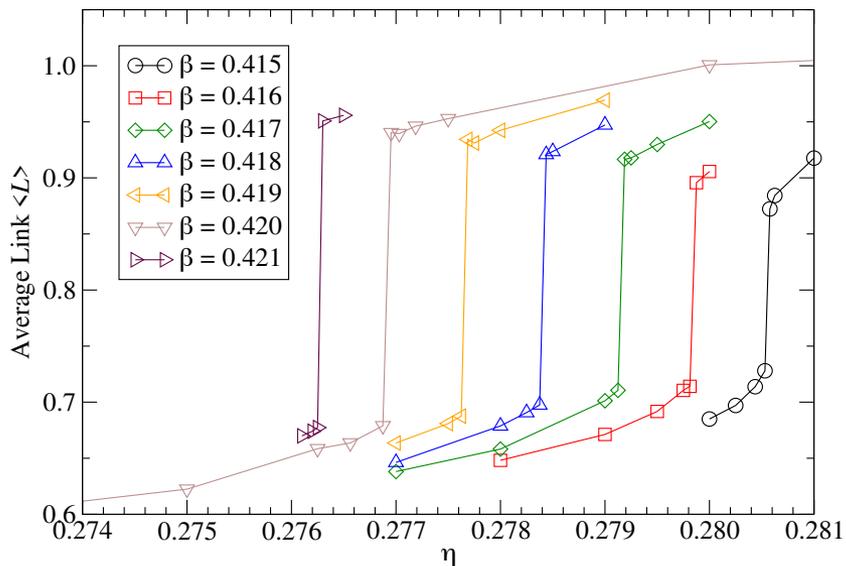


(3+1)D Z_3 model at finite density

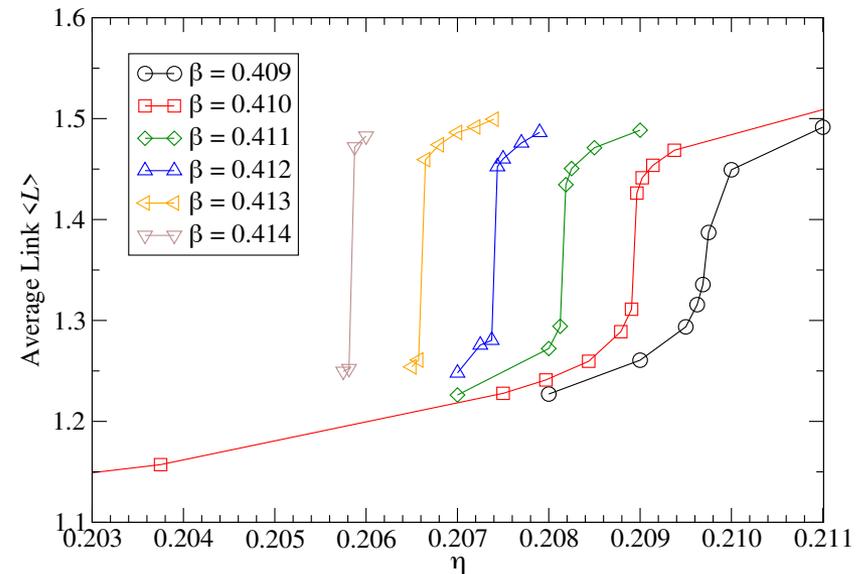
SA-Kuramashi, JHEP10(2023)077

- Again, $\Delta\langle L \rangle$ becomes smaller when β becomes smaller, as expected

Average link@ $\mu = 1$



Average link@ $\mu = 2$

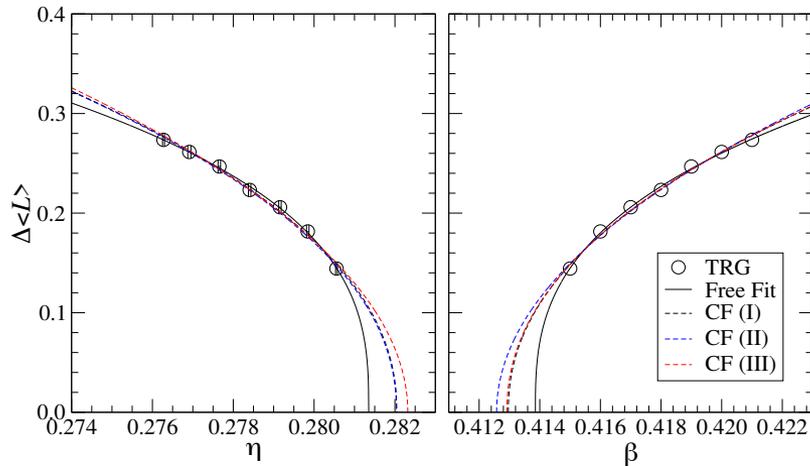


CEP in (3+1)D Z_3 model at finite μ

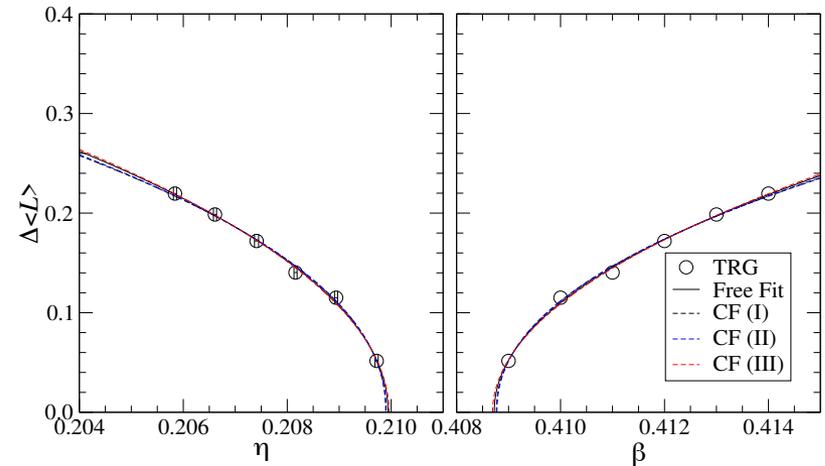
SA-Kuramashi, JHEP10(2023)077

- CEP is determined via the similar fit to the Z_2 model
 - $\Delta\langle L \rangle = A(\beta - \beta_c)^p$ and $\Delta\langle L \rangle = B(\eta_c - \eta)^q$
 - According to the mean field theory, $p = q = 0.5$
 - The simultaneous fit among different μ suggests $p = \mathbf{0.46(2)}$, $q = \mathbf{0.46(3)}$

$\mu = 1$



$\mu = 2$

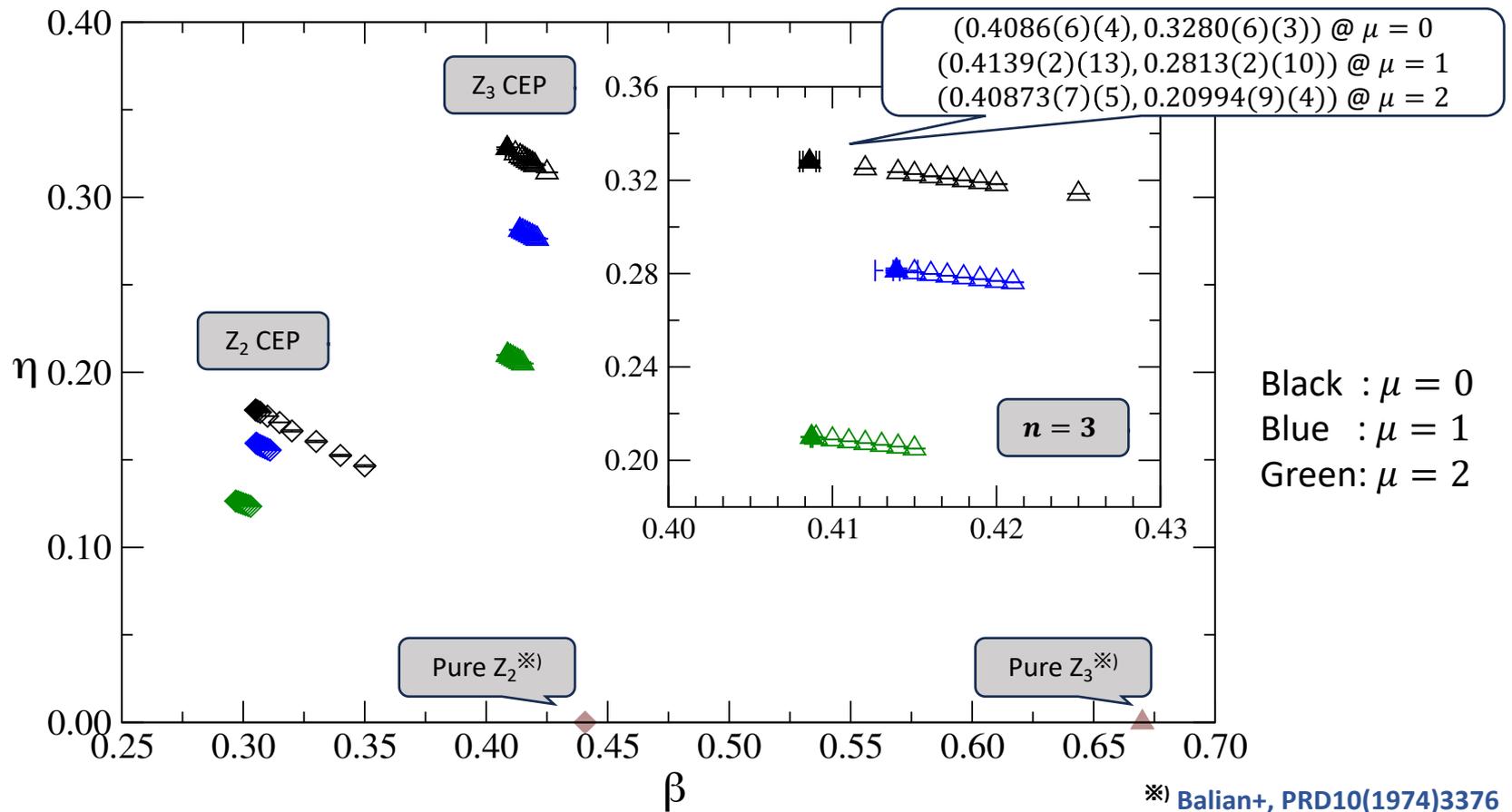


Phase diagram of Z_n gauge-Higgs model ($n=2,3$)

SA-Kuramashi, JHEP10(2023)077

- n -dependence in the resulting CEP is consistent w/ previous studies

Cf. U(1) gauge-Higgs studies, Baig-Clua, PRD57(1998)3902, Franzki+, PRD57(1998)6625



Lüscher's admissibility condition

- Beyond the standard Wilson gauge action?

- Lüscher's gauge action for the U(1) gauge fields:

$$\beta S_g = \beta \sum_{n,\mu > \nu} \frac{1 - \operatorname{Re} P_{\mu\nu}(n)}{1 - \|1 - P_{\mu\nu}(n)\|/\epsilon} \quad \text{if} \quad \|1 - P_{\mu\nu}(n)\| < \epsilon$$

and $\beta S_g = \infty$, otherwise

- The gauge fields are separated into disconnected subspaces, corresponding to topological charge

Lüscher, NPB549(1999)295-334

- In the MC simulation, however, the topological change is substantially suppressed \Rightarrow Topological freezing

Cf. Fukaya-Onogi, PRD68(2003)074503

Why don't we take the advantage of TRG?

- TRG allows us to compute the path integral w/o suffering from the sign problem and **the full contributions from every topological sector should be automatically included**

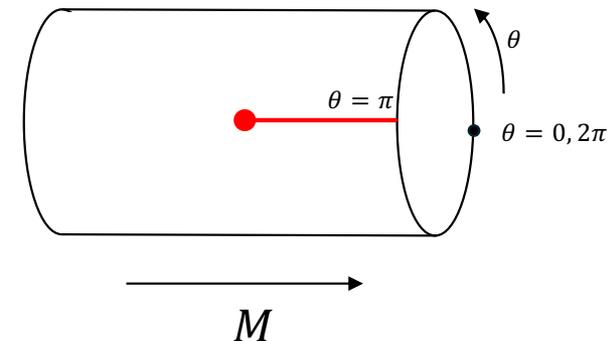
- As an example, we consider the U(1) gauge-Higgs model w/ a θ term in (1+1)D

$$S = \beta S_g + S_h + S_\Theta$$

$$S_h = -\sum_n [\sum_v \{ \phi^*(n) U_v \phi(n + \hat{v}) + \phi^*(n + \hat{v}) U_v^* \phi(n) \} + M |\phi(n)|^2 + \lambda |\phi(n)|^4]$$

$$S_\Theta = -\frac{i\theta}{2\pi} \sum_n \log P_{12}(n)$$

- At $\theta = \pi$, the first-order transition takes place w/ $M > M_c$ and the critical behavior at $M = M_c$ is in the **2D Ising universality class** [Gattringer+, NPB935\(2018\)344-364](#)
[Komargodski+, SciPost Phys. 6\(2019\)003](#)



- The MC simulation for this model is extremely difficult due to **the complex action problem and the topological freezing**

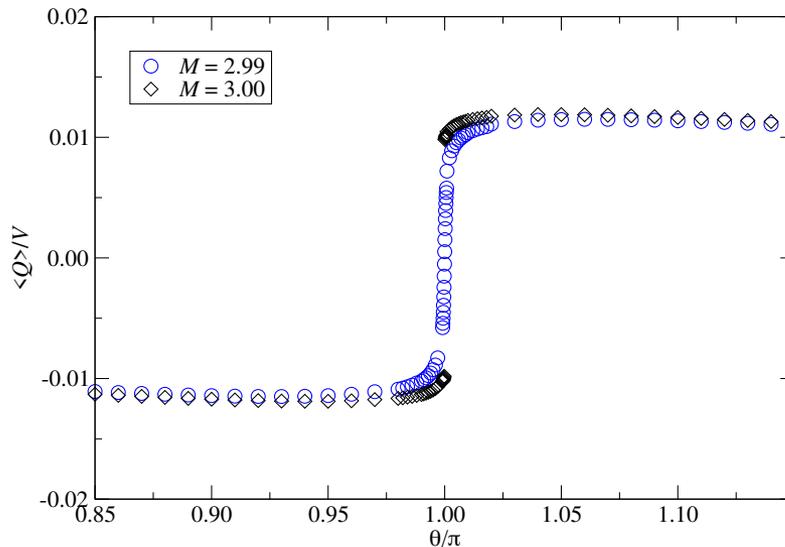
Hunting the critical endpoint

SA-Kuramashi, JHEP09(2024)086

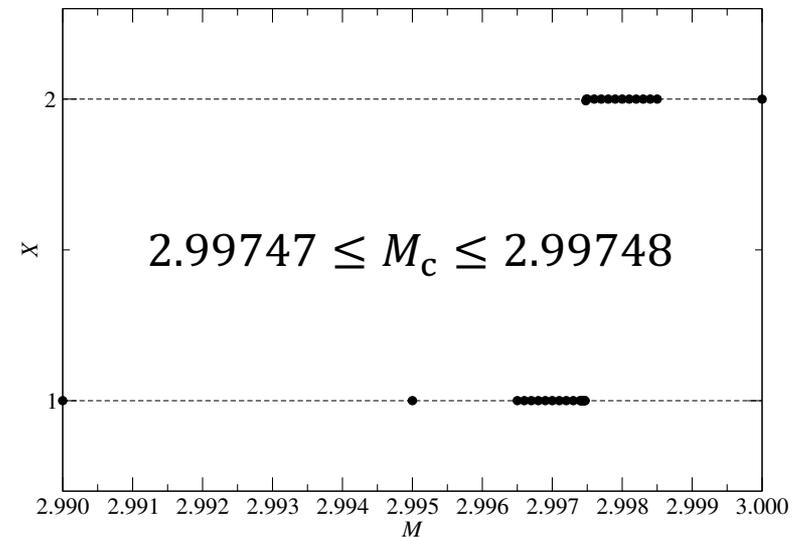
- Discontinuity in the topological charge is vanishing by decreasing the mass M
- Computing the ground-state degeneracy, we can bound the critical mass M_c

Gu-Wen, PRB80(2009)155131

Topological charge density



Ground-state degeneracy



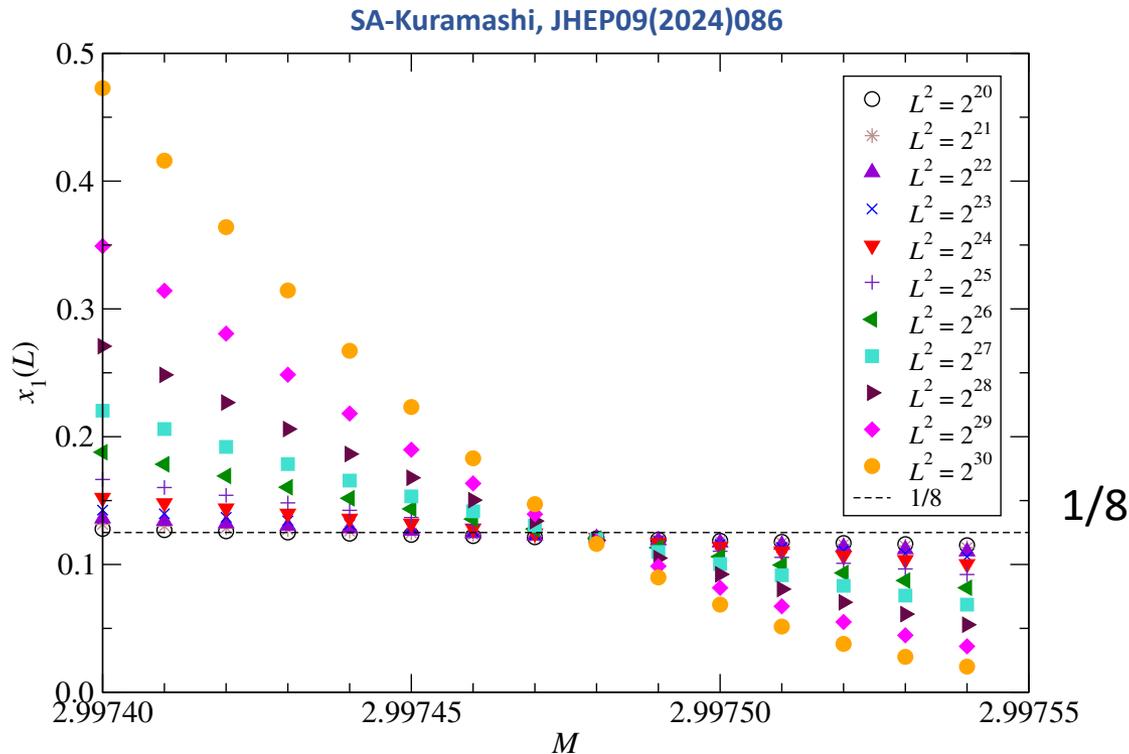
$$w/\beta = 3, \lambda = 0.5, \epsilon = 1, K_g = K_h = 20, D = 160$$

Identification of the universality class

- Transfer matrix from the TN representation [Gu-Wen, PRB80\(2009\)155131](#)

- **Scaling dimensions are available via** $x_n(L) = \frac{1}{2\pi} \ln \frac{\lambda_0(L)}{\lambda_n(L)}$

- The volume independence in $x_1(L)$ is observed w/ $x_1(L) = 1/8$, which agrees with the 2D Ising universality class



$$w/\beta = 3, \lambda = 0.5, \epsilon = 1, K_g = K_h = 20, D = 160$$

Tensor-network-based level spectroscopy

Ueda-Oshikawa, PRB108(2023)024413

- Assuming the 2D Ising universality class, we employ the level spectroscopy to determine the critical mass M_c from scaling dimensions intersections
- The algorithmic-parameter dependence of M_c seems well suppressed
- Consistent not only with the previous bound from the ground-state degeneracy, but also comparable with the previous MC result based on dual representation employing the Villain-type gauge action: $M_c = 2.989(2)$ [Gattringer+, NPB935\(2018\)344-364](#)

SA-Kuramashi, JHEP09(2024)086

K_g	K_h	χ	D	M_c
24	20	8	192	2.9982886(1)
22	20	8	176	2.9998263(13)
20	20	8	160	2.9974765(14)
24	10	6	144	2.9929635(1)
22	10	6	132	2.9945222(9)
20	10	7	140	2.9921698(6)

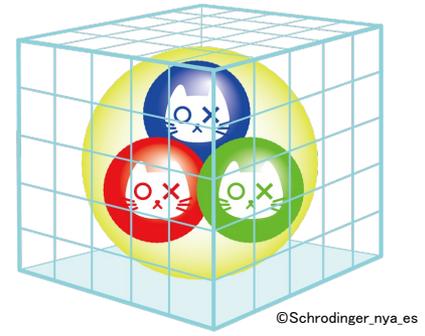
χ is another algorithmic parameter to compress the initial bond dimension from $K_g K_h$ to $K_g \chi$

Summary & Future Perspectives

- TRG approach for the higher-dimensional LGTs
 - Gauge sector \Rightarrow normal TN formulation, but a regularization scheme is necessary
 - Fermion sector \Rightarrow GrassmannTN formulation
 - **The technology needed to investigate the actual 4D QCD is gradually coming together**
- Enhancing the accuracy of the method is crucial for advancing qualitative insights into quantitative understanding
- **The finite-bond effect should be under control**
 - Any lesson from 2D systems? Tagliacozzo+, PRB78(2008)024410 , Pollmann+, PRL102(2009)255701
Ueda-Oshikawa, PRB108(2023)024413, Huang+, PRB107(2023)205123
...
 - Entanglement filtering Hauru+, PRB97 (2018) 045111, Lyu-Kawashima, PRE111(2025)054140, ...
 - Lesson from the PEPS/TNS community Vanderstraeten+, PRE98(2018)042145, Emonts, PRD107(2023)014505, Vlaar-Corboz, PRL130(2023)130601, ...
 - TN+MC Ferris, arXiv:1507.00767, Zohar-Cirac, PRD97(2018)034516, Arai+, PRD107(2023)114515, Todo, arXiv:2412.02974, ...

Appendices

A quick look at the QCD



- The Kogut-Susskind formulation

- Hamiltonian

$$\hat{H} = \frac{1}{2} \sum_{\mathbf{n} \in \Lambda_3} \sum_{\sigma=1,2,3} \left[\hat{\psi}(\mathbf{n})^\dagger \hat{U}_\nu(\mathbf{n}) \hat{\psi}(\mathbf{n} + \sigma) + \text{h.c.} \right] + m \sum_{\mathbf{n}} (-1)^{\mathbf{n}} \psi(\mathbf{n})^\dagger \psi(\mathbf{n}) - \mu \sum_{\mathbf{n}} \psi(\mathbf{n})^\dagger \psi(\mathbf{n})$$

$$+ \frac{g^2}{2} \sum_{\mathbf{n}} \hat{E}(\mathbf{n})^2 + \frac{1}{g^2} \sum_{\mathbf{n}, \sigma > \tau} \text{Tr} \left[2 - \hat{P}_{\sigma\tau}(\mathbf{n}) - \hat{P}_{\sigma\tau}^\dagger(\mathbf{n}) \right]$$

- Lagrangian (Action)

$$S = \frac{1}{2} \sum_{\mathbf{n} \in \Lambda_{3+1}} \sum_{\nu=1,2,3,4} \left[e^{\mu\delta_{\nu,4}} \eta_\nu(\mathbf{n}) \bar{\psi}(\mathbf{n}) U_\nu(\mathbf{n}) \psi(\mathbf{n} + \hat{\nu}) - e^{-\mu\delta_{\nu,4}} \eta_\nu(\mathbf{n} + \hat{\nu}) \bar{\psi}(\mathbf{n} + \hat{\nu}) U_\nu^\dagger(\mathbf{n}) \psi(\mathbf{n}) \right]$$

$$+ m \sum_{\mathbf{n}} \bar{\psi}(\mathbf{n}) \psi(\mathbf{n}) + \frac{2}{g^2} \sum_{\mathbf{n}, \nu > \rho} \Re \text{Tr} \left[\mathbf{1} - U_\nu(\mathbf{n}) U_\rho(\mathbf{n} + \nu) U_\nu^\dagger(\mathbf{n} + \rho) U_\rho^\dagger(\mathbf{n}) \right]$$