

# Tensor network toward the lattice QCD

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2024.9.25 @ RPMBT22

# 50<sup>th</sup> anniversary of lattice QCD

- **“Confinement of quarks” by K. G. Wilson in 1974**

Kenneth G. Wilson

*Laboratory of Nuclear Studies, Cornell University, Ithaca, New York 14850*

(Received 12 June 1974)

A mechanism for total confinement of quarks, similar to that of Schwinger, is defined which requires the existence of Abelian or non-Abelian gauge fields. It is shown how to quantize a gauge field theory on a discrete lattice in Euclidean space-time, preserving exact gauge invariance and treating the gauge fields as angular variables (which makes a gauge-fixing term unnecessary). The lattice gauge theory has a computable strong-coupling limit; in this limit the binding mechanism applies and there are no free quarks. There is unfortunately no Lorentz (or Euclidean) invariance in the strong-coupling limit. The strong-coupling expansion involves sums over all quark paths and sums over all surfaces (on the lattice) joining quark paths. This structure is reminiscent of relativistic string models of hadrons.

## I. INTRODUCTION

The success of the quark-constituent picture

particles over short times and short distances.

The polarization effects which prevent the appearance of electrons in the final state take place [Wilson, PRD10\(1974\)2445](#)

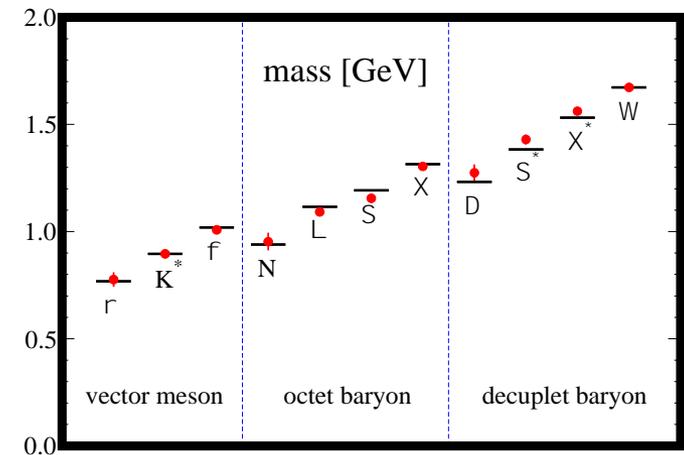
- **Successes over the past 50 years**

- Hadron mass, matrix elements

- Nuclear force, ...

- **Monte Carlo simulations on supercomputers**

- Great development of algorithms and supercomputers



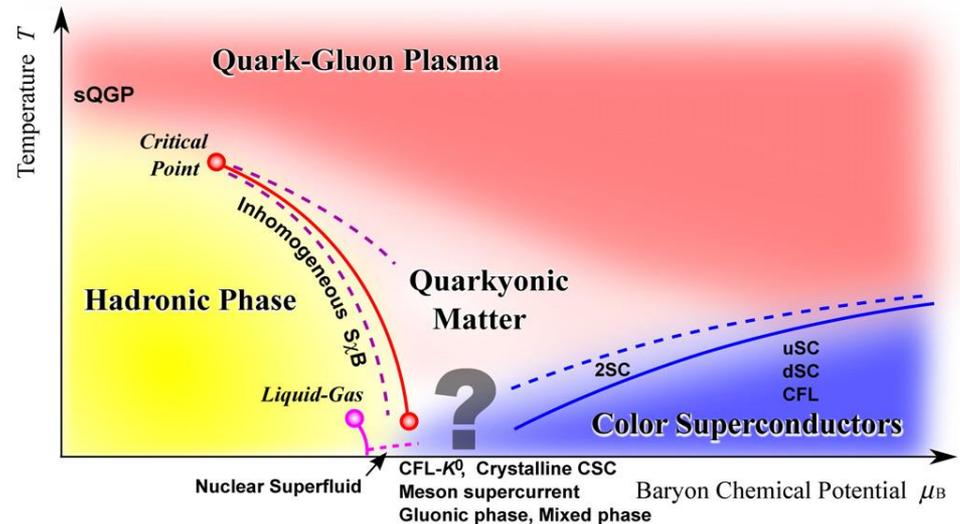
# Can we solve the QCD using only the MC?

- No, unfortunately
- MC has the **sign problem**, that has prevented numerous studies

## • QCD at finite density

- Real time evolution
- Strong CP problem
- Chiral gauge theory
- Other finite-density systems
- Supersymmetry
- ...

- Many attempts have been made to overcome the sign problem in the computational physics



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

Cf. Talk by Siu Chin on Tue, 24/9

Cf. Talk by Alexander Lichtenstein on Wed, 25/9

# Tensor Network?

- **Theoretical or numerical methods based on representing quantum many-body systems as a network of numerous tensors (multi-index objects)**

Cf. Talk by Garnet Kin-Lic Chan on Wed 25/9

- Originated in statistical physics
- Extremely successful for 1D quantum systems

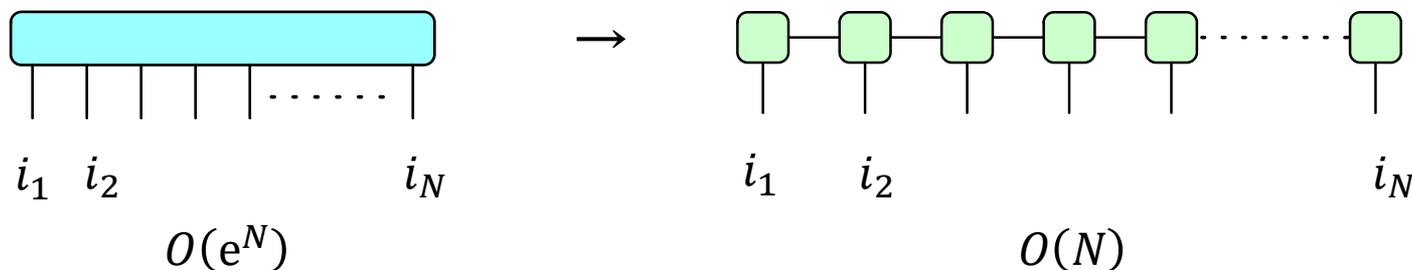
Baxter, J. Math. Phys. 9 (1968) 650

- **Density Matrix RG**

White, Phys. Rev. Lett. 69 (1992) 2863  
Feenberg Memorial Medal in 2019 (RPMBT-20)

- **Matrix Product State (MPS)**

Schollwöck, Rev. Mod. Phys. 77 (2005) 259-315



- Accurate information compression with finite **bond dimensions** is available when the entanglement of the system is small
- **No sign problem**

# How to use TN for many-body problems

- Within the **Hamiltonian** formalism

Cf. Poster by Ryo Watanabe [Board:13]

- TN as a variational ansatz for the **many-body state**  $|\Psi\rangle$

$$|\Psi\rangle = \begin{array}{cccccc} \square & \square & \square & \square & \square & \dots & \square \\ | & | & | & | & | & & | \end{array}$$

- Determines the ground state and excited states
- **Variational optimization** of the TN

White, Phys. Rev. Lett. 69 (1992) 2863

Nishino-Hieida-Okunishi-Maeshima-Akutsu-Gendiari, Prog. Theor. Phys. 105 (2001) 409-17

Vidal, Phys. Rev. Lett. 91 (2003) 147902

Verstraete-Cirac, arXiv:cond-mat/0407066

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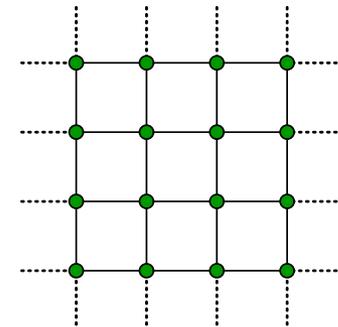
- Within the **Lagrangian** formalism

- **Path integral**  $Z$  is described as a TN

- Contraction of the TN

- **Real-space RG** on the TN

$$Z =$$



Nishino-Okunishi, J. Phys. Soc. Japan 65 (1996) 891

Levin-Nave, Phys. Rev. Lett. 99 (2007) 120601

Gu-Wen, Phys. Rev. B80(2009)155131

Evenbly-Vidal, Phys. Rev. Lett. 115(2015)180405

...

# TN toward the lattice QCD

- “Kogut ladder” can be a good roadmap
- Gradually try to increase symmetry and 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 to regularize **bosons**
  - Accuracy vs computational cost

Cf. “A quantum-simulation program for QCD?”  
by Zohreh Davoudi in RPBMT-21

## 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

# Starting from 2D, (1+1)D systems

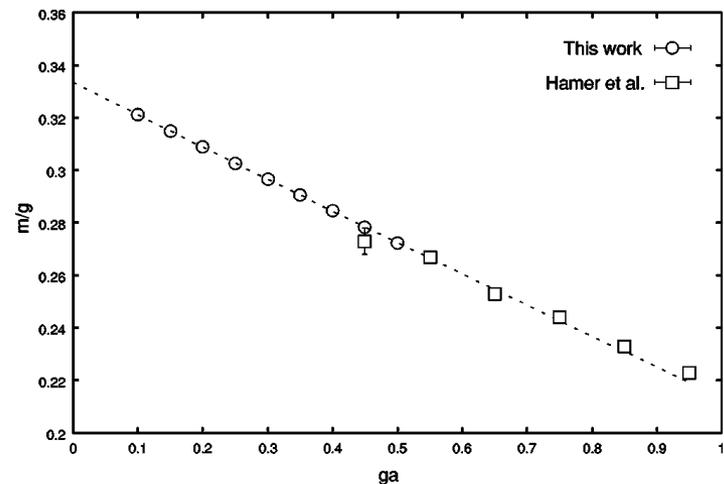
- **Schwinger model ( = 2D QED )**
- The most QCD-like theory in 2D
  - Chiral symmetry breaking
  - Confinement
  - Topological term
- The first application of TN to the lattice gauge theory
  - Critical property at  $\theta = \pi$ 
    - 2D Ising universality

$$\left(\frac{m}{g}\right)_c = 0.3335(2). \quad \nu = 1.01(1)$$

$$\beta/\nu = 0.125(5).$$

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  
 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  
 Shimizu-Kuramashi, PRD97(2018)034502  
 Magnifico-Vodola-Ercolessi-Kumar-Müller-Bermudez, PRD99(2019)014503  
 Magnifico-Vodola-Ercolessi-Kumar-Müller-Bermudez, 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-Kühn, PRD108(2023)0145156  
 Dempsey-Klebanov-Benjamin-Søggard-Zan, PRL132(2024)031603  
 Yosprakob-Nishimura-Okunishi, JHEP11(2023)187  
 Itou-Matsumoto-Tanizaki, JHEP11(2023)231, arXiv:2407.11391  
 Kanno-SA-Murakami-Takeda, Lattice2024  
 ...



# Starting from 2D, (1+1)D systems

- **2D QCD**

- Testing ground for non-Abelian gauge theories

- **SU(N) DoFs have to be regularized**

- Removing the gauge DoFs
- Irreducible representation
- Quantum link formulation
- Qubit regularization
- Subgroups, Sampling, ...

- Regularization is also necessary in quantum computing

Kühn-Zohar-Cirac- Bañuls, JHEP07(2015)130  
 Silvi-Rico-Dalmonete-Tschirsich-Montangelo, Quantum1(2017)9  
 Bañuls-Cichy-Cirac-Jansen-Kühn, PRX7(2017)041046  
 Sala-Shi-Kühn-Bañuls-Demler-Cirac, PRD98(2018)034505  
 Silvi-Sauer-Tschirsich-Montangelo, PRD100(2019)074512  
 Bazavov-Catterall-Jha-Unmuth-Yockey, PRD99(2019)114507  
 Fukuma-Kadoh-Matsumoto, PTEP2021(2021)123B03  
 Hirasawa-Matsumoto-Nishimura-Yosprakob, JHEP12(2021)011  
 Rigobello-Magnifico-Silvi-Montangelo, arXiv:2308.04488  
 Bloch-Lohmayer, NPB986(2023)116032  
 Liu-Bhattacharya-Chandrasekharan-Gupta, arXiv:2312.17734  
 Hayata-Hidaka-Nishimura, JHEP07(2024)106  
 Asaduzzaman-Catterall-Meurice-Sakai-Toga, JHEP05(2024)195  
 Samberger-Bloch-Lohmayer, Lattice2024  
 Ho Pai-SA-Todo, Lattice2024

...

Horn, Phys. Lett. B100(1981)149-151  
 Orland-Rohrlich, NPB338(1990)647-672  
 Chandrasekharan-Wiese, NPB492(1997)455-471  
 Brower- Chandrasekharan-Wiese, PRD60(1999)094502

...

Singh-Chandrasekharan, PRD100(2019)054505

...

Cf. Bañuls+, Eur. Phys. J. D74(2020)165

...

# Starting from 2D, (1+1)D systems

- **Other models:**  $\phi^4$  theory

Sugihara, JHEP05(2004)007

Milsted-Haegeman-Osborne, PRD88(2013)085030

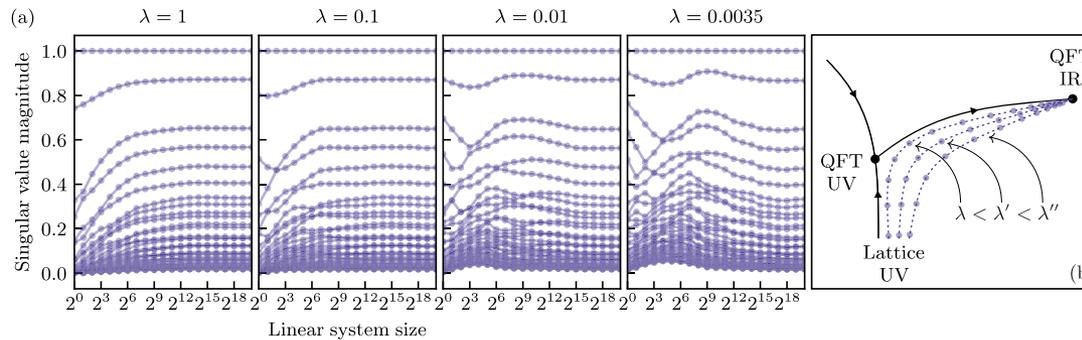
Gillman-Rajantie, PRD96(2017)094509, PRD97(2018)094505

Shimizu, Mod. Phys. Lett. A27(2012)1250035

Kadoh-Kuramashi-Nakamura-Sakai-Takeda-Yoshimura, JHEP03(2018)141, JHEP05(2019)184

Zahra-Takeda-Yamazaki, Lattice2024

- RG prescription within TN



Delcamp-Tilloy, PRR2(2020)033278

- Critical coupling in the continuum limit by various numerical methods

Method	Critical coupling
<b>MPS</b> <small>Milsted+, PRD88(2013)085030</small>	11.064(20)
Monte Carlo <small>Bronzin+, PRD99(2019)034508</small>	11.055(20)
<b>TRG</b> <small>Kadoh+, JHEP05(2019)184</small>	10.913(56)
<b>Gilt-TNR</b> <small>Delcamp+, PRR2(2020)033278</small>	11.0861(90)
<b>MPS</b> <small>Vanhecke+, arXiv:2104.10564</small>	11.09698(31)

# Starting from 2D, (1+1)D systems

- **Other models:** Four-fermion interactions

Takeda-Yoshimura, PTEP2015(2015)043B01

Jünemann-Piga-Ran-Lewenstein-Rizzi-Bermudez, PRX7(2017)031057

Bermudez-Tirrito-Rizzi-Lewenstein-Hands, Ann. Phys. NY399(2018)148

Tirrito-Rizzi-Sierra-Lewenstein-Bermudez, PRB99(2019)125106

Bañuls-Cichy-Kao-Lin-Lin-Tan, PRD100(2019)094504

SA, PRD108(2023)034514

Bañuls-Cichy-Hung-Kao-Lin-Singh, arXiv:2407.11295

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- Toy models for QCD

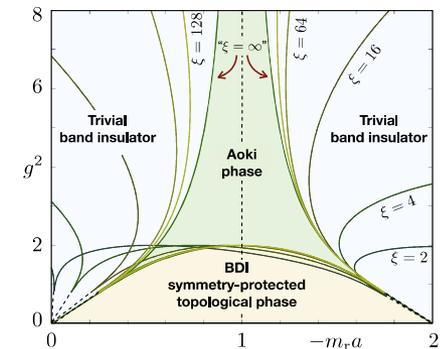
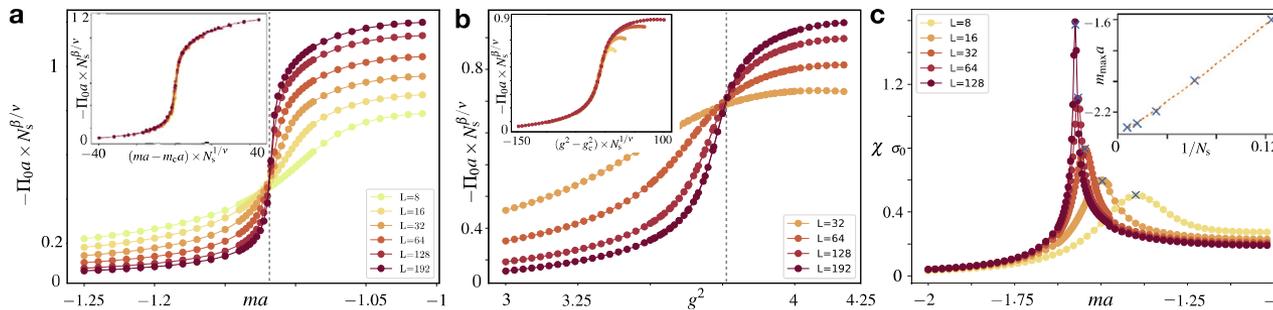
- Gross-Neveu model

- Relation to strongly-correlated systems

- Aoki phase (parity-symmetry breaking phase)

Aoki, PRD30(1984)2653

- Topological phases



Bermudez+, Ann. Phys. NY399(2018)148

# Starting from 2D, (1+1)D systems

- And other models

- **Zn and U(1) gauge theories**

- Topological term
- Toward chiral gauge theories

Sugihara, JHEP07(2005)022  
 Unmuth–Yockey-Zhang-Bazavov-Meurice-Tsai, PRD98(2018)094511  
 Kuramashi-Yoshimura, JHEP04(2020)089  
 SA-Kuramashi, JHEP09(2024)086  
 ...

- **O(N) sigma model, CP(N-1) model**

- Study of entanglement entropy
- Topological term
  - Haldane’s conjecture

Milsted, PRD93(2016)085012  
 Yang-Liu-Zou-Xie-Meurice, PRE93(2016)012138  
 Kawauchi-Takeda, PRD93(2016)114503  
 Bazavov-Meurice-Tsai-Unmuth–Yockey-Yang-Zhang, PRD96(2017)034514  
 Bruckmann-Jansen-Kühn, PRD99(2019)074501  
 Nakayama-Funcke-Jansen-Kao-Kühn, PRD105(2022)054507  
 Luo-Kuramashi, JHEP03(2024)020, arXiv:2406.08865  
 Aizawa-Takeda, Lattice2024  
 ...

- **SUSY on a lattice**

Kadoh-Kuramashi-Nakamura-Sakai-Takeda-Yoshimura, JHEP03(2018)141

- **Euclidean quantum gravity**

Dittrich-Mizera-Steinhaus, New Jour. Phys. 18(2016)053009  
 Asaduzzaman-Catterall-Unmuth–Yockey, PRD102(2020)054510  
 Ito-Kadoh-Sato, PRD106(2022)106044

# Now, moving on to the higher dimensions

- TN computations in higher dimensions (3D, 4D) are challenging
  - Gauge DoFs cannot be eliminated as in (1+1)D
  - “Curse of dimensionality”
  - As dimensions increase, so do computational costs
    - Computational memory
    - Execution time
  - It seems difficult to extend a method that is efficient in (1+1)D
  - Development of the algorithms specialized for higher dimensions is of essential importance
  - **Several promising candidates**

# Higher-dimensional TN algorithms

- **Tensor Renormalization Group (TRG)**

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

- **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**

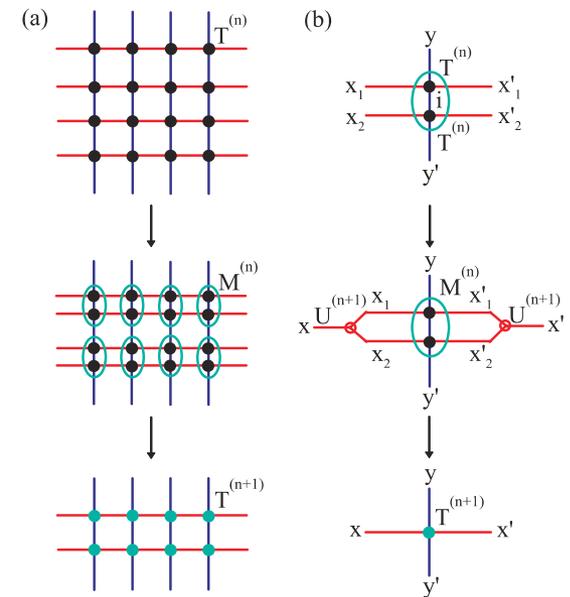
Kadoh-Nakayama, arXiv:1912.02414

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

- **Minimally-Decomposed TRG**

Nakayama, arXiv:2307.14191

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



Xie+, PRB86(2012)045139

# Higher-dimensional TN algorithms

- **Tensor Network State (TNS)**

- Variational wave function

- **(infinite) Projected Entangled Pair States (PEPS)**

Verstraete-Cirac, arXiv:cond-mat/0407066

Cf. "Tensor Product State" by Nishino+, Prog. Theor. Phys. 105 (2001) 409-17

Corboz-Orús-Bauer-Vidal, PRB81(2010)165104

- The natural generalization of MPS

- Satisfies the area law of entanglement entropy

- **Tree Tensor Network (TTN)**

Shi-Duan-Vidal, PRA74(2006)022320

Tagliacozzo-Evenbly-Vidal, PRB80(2009)235127

Silvi-Giovannetti-Montangero-Rizzi-Cirac-Fazio, PRA81(2010)062335

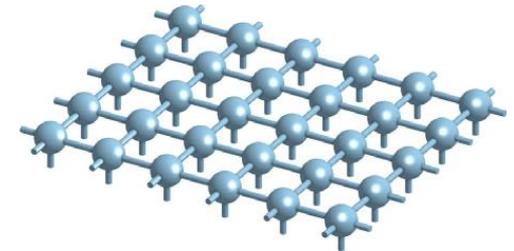
- Hierarchical tensor network w/o loops

- Similarity with the real-space RG

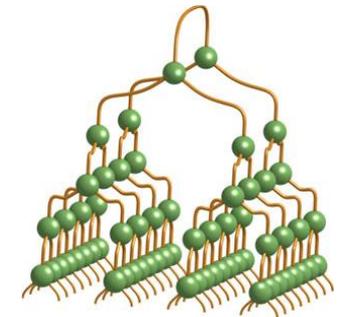
- **Isometric TNS (isoTNS)**

Zaletel-Pollmann, PRL124(2020)037201

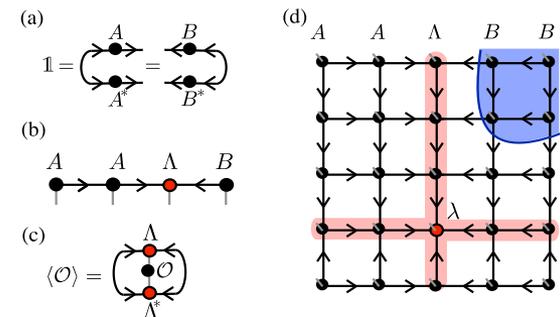
- Generalization of the isometric condition of MPS to higher dimensions



Felser+, PRX10(2020)041040



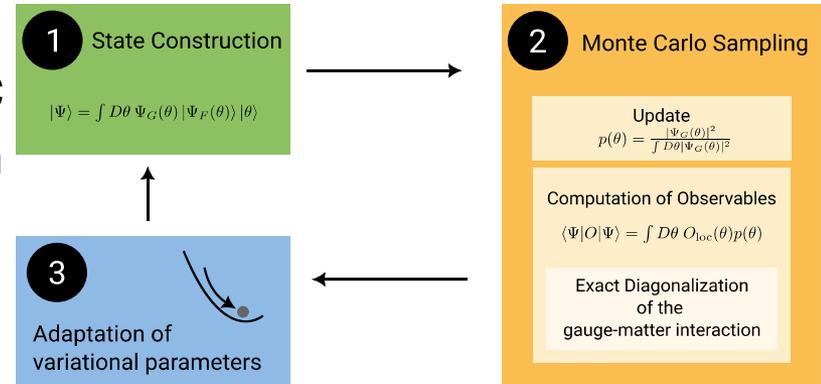
Felser+, PRX10(2020)041040



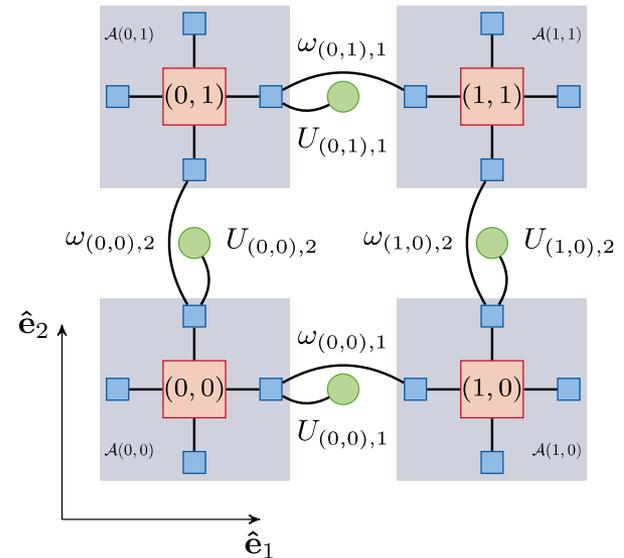
Zaletel+, PRL124(2020)037201

# Higher-dimensional TN algorithms

- **Gauged Gaussian PEPS (GGPEPS)**
- **Deals with the gauge DoFs with the MC sampling rather than discretizing them**
- Constructs an ansatz state as PEPS
- The probability is described by the norms of states
- **Sign-problem-free MC simulation**



Bender-Emonts-Cirac, PRR5(2023)043128



Emonts- Bañuls-Cirac-Zohar, PRD102(2020)074501

Zohar-Burrello, New J. Phys.18(2016)043008  
Zohar-Cirac, PRD97(2018)034510

[Review] Kelman-Borla-Gomelski-Elyovich-Roose-Emonts-Zohar, arXiv:2404.13123

# Status of TN in 3D, (2+1)D

- Ising, Potts models [TRG, TNS]

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

Dai-Cho-Batchelor-Zhou, PRE89(2014)062142

Wang-Xie-Cheng-Bruce-Xiang, Chin.Phys.Lett.31(2014)070503

Bloch-Lohmayer-Schweiß-Unmuth-Yockey, Lattice2021

Jha, arXiv:2201.01789

Kadow-Pollmann-Knap, PRB107(2023)205106

- $\phi^4$  theory [TRG]

SA-Kuramashi-Yoshimura, PRD104(2021)034507

- O(N) models [TRG]

Bloch-Jha-Lohmayer-Meister, PRD104(2021)094517

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

- Zn gauge theories [TRG, GGPEPS, TNS]

Tagliacozzo-Vidal, PRB83(2011)115127

Tagliacozzo-Celi-Lewenstein, PRX4(2014)041024

Kuramashi-Yoshimura, JHEP08(2019)023

Emonts-Bañuls-Cirac-Zohar, PRD102(2020)074501

Crone-Corboz, PRB101(2020)115143

Robina-Bañuls-Cirac, PRL126(2021)050401

SA-Kuramashi, JHEP05(2022)102

Emonts-Kelman-Borla-Moroz-Gazit-Zohar, PRD107(2023)014505

Nakayama-Schneider, arXiv:2407.14226

- Infinite-coupling U(N) model [TRG]

Milde-Bloch-Lohmayer, Lattice2021

- QED [TNS, GGPEPS]

Zohar-Burrello-Wahl-Cirac, Ann. Phys. 363(2015)84

Zapp-Orús, PRD95(2017)114508

Felser-Silvi-Collura-Montangero, PRX10(2020)041040

Bender-Emonts-Cirac, PRR5(2023)043128

- SU(N) gauge theories [TRG, TNS]

Zohar-Wahl-Burrello-Cirac, Ann. Phys. 374(2016)84

Cataldi-Magnifico-Silvi-Montangero, PRR6(2024)033057

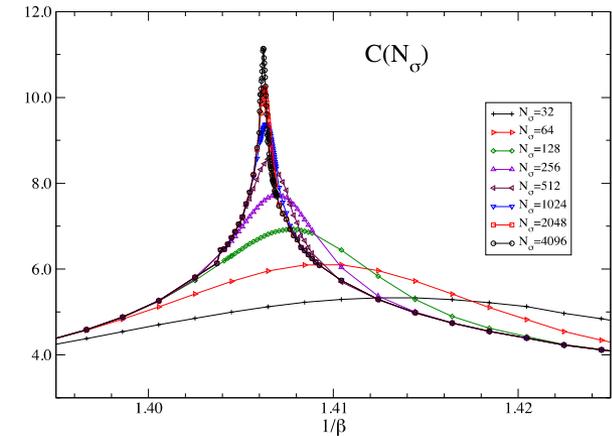
Kuwahara-Tsuchiya, PTEP022(2022)093B02

Yosprakob-Okunishi, arXiv:2406.16763

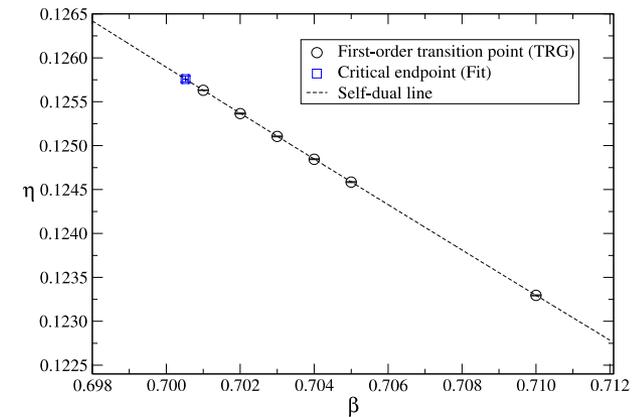
# $Z_2$ gauge theories w/ TRG

- Second-order phase transition at finite temperature
- TRG confirmed the 2D Ising universality as conjectured by Svetitsky and Yaffe  
Svetitsky-Yaffe, NPB210(1982)423
- Phase transitions in 3D  $Z_2$  gauge-Higgs model
- TRG confirmed the self-dual transition line  
Balian-Drouffe-Itzykson, PRD11(1975)2098
- Resulting critical endpoint is consistent with the latest MC estimation

Method	Critical endpoint
MC <a href="#">Somoza+, PRX11(2021)041008</a>	0.701
TRG <a href="#">SA+, JHEP05(2022)102</a>	0.70051(7)



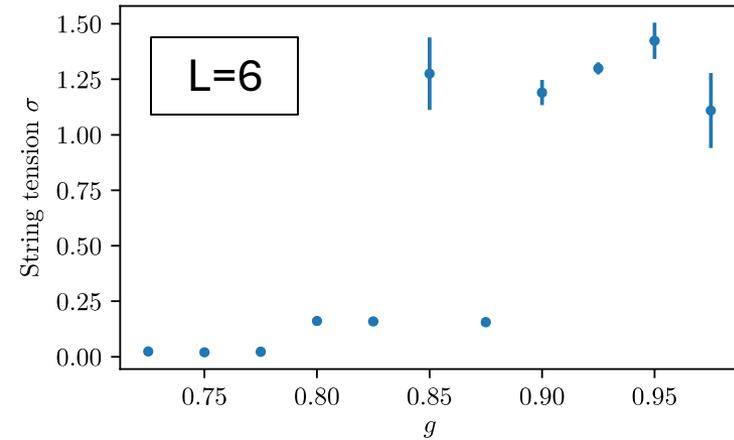
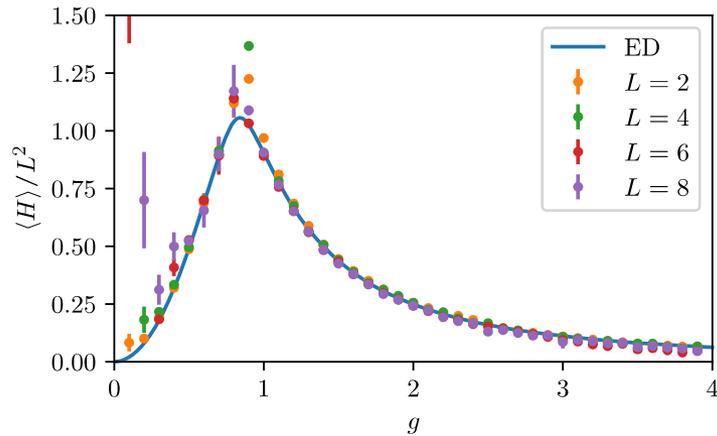
Kuramashi+, JHEP08(2019)023



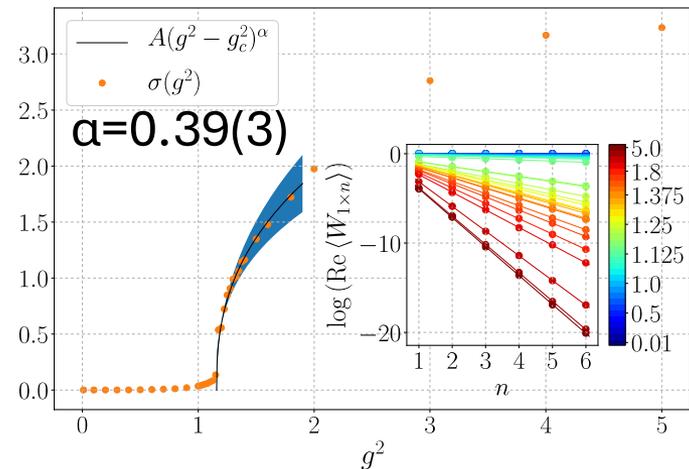
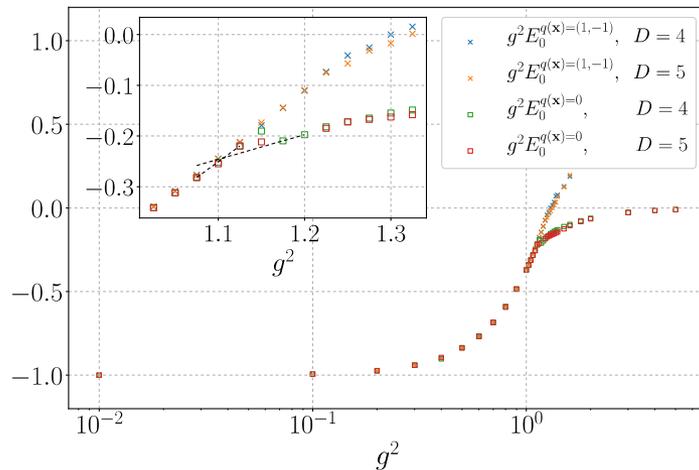
SA+, JHEP05(2022)102

# $Z_3$ gauge theory w/ GGPEPS, iPEPS

- Ground state energy and string tension by GGPEPS [Emonts+, PRD102\(2020\)074501](#)



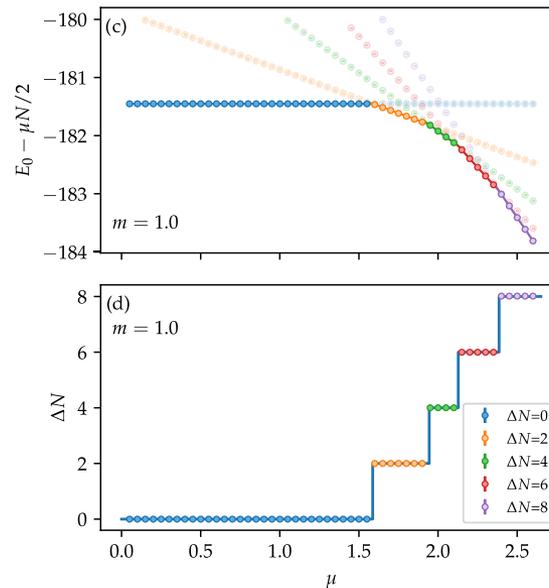
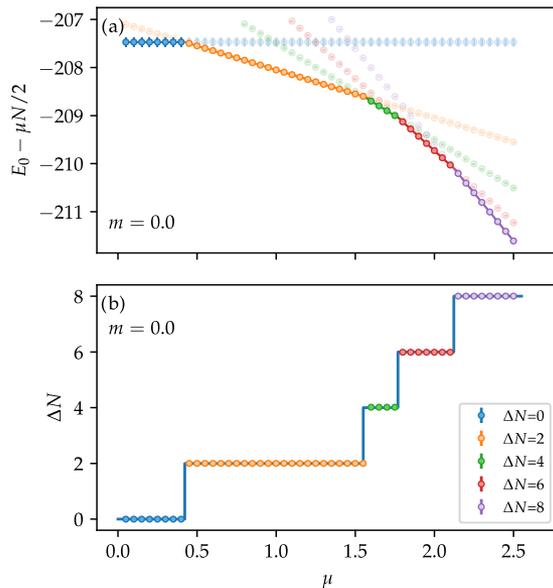
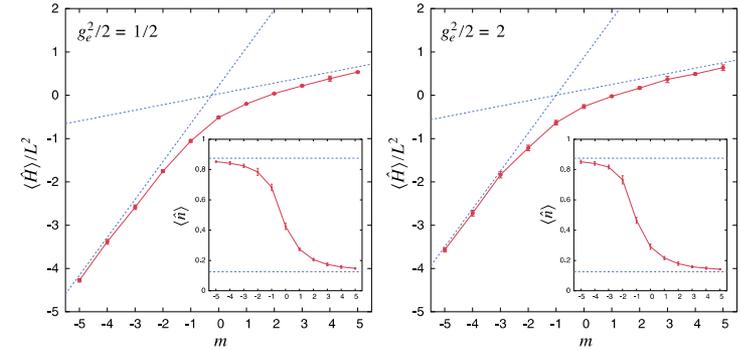
- Ground state energy and string tension by iPEPS [Robina+, PRL126\(2021\)050401](#)



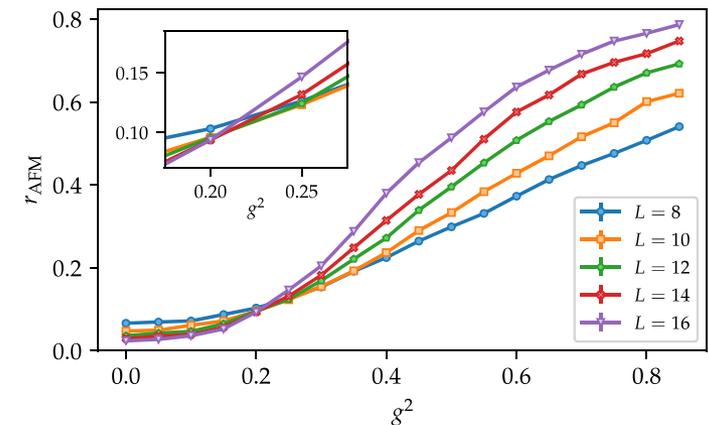
# QED w/ TTN, GGPEPS

- TTN simulation w/ finite magnetic coupling
- Ground state energy on an  $L=8$  lattice is compared with the perturbation theory
- Confinement-deconfinement phase transition is captured by GGPEPS
- Finite-density computations are also done by GGPEPS, avoiding the sign problem

Felser+, PRX10(2020)041040



Method	Transition point
MC Xu+, PRX9(2019)021022	0.40(5)
GGPEPS Bender+, PRR5(2023)043128	0.15(2)



Bender+, PRR5(2023)043128

# Status of TN in 4D, (3+1)D

- Ising model [TRG]

SA-Kuramashi-Yamashita-Yoshimura, PRD100(2019)054510  
Sugimoto-Sasaki, Lattice2024

- $\phi^4$  theory [TRG]

SA-Kadoh-Kuramashi-Yamashita-Yoshimura, JHEP09(2020)177  
SA-Kuramashi-Yoshimura, PRD104(2021)034507

- Zn gauge-Higgs model at finite density [TRG]

SA-Kuramashi, JHEP05(2022)102, 10(2023)077

- Infinite-coupling U(N) model [TRG]

Milde-Bloch-Lohmayer, Lattice2021

- Nambu-Jona-Lasinio model at finite density [TRG]

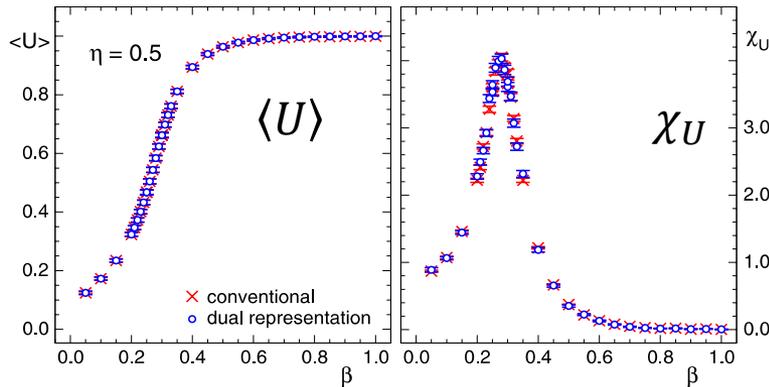
SA-Kuramashi-Yamashita-Yoshimura, JHEP01(2021)121

- QED [TNS]

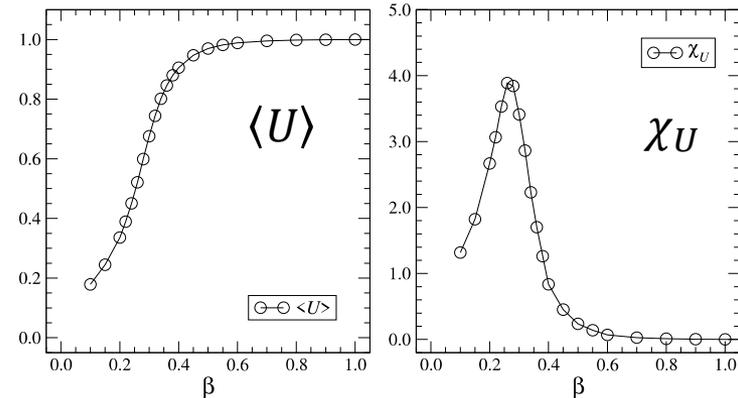
Magnifico-Felser-Silvi-Montangelo, Nat.Commun.12(2021)3600

# $Z_3$ gauge-Higgs model w/ TRG

- Results by the MC and TRG at vanishing chemical potential are consistent

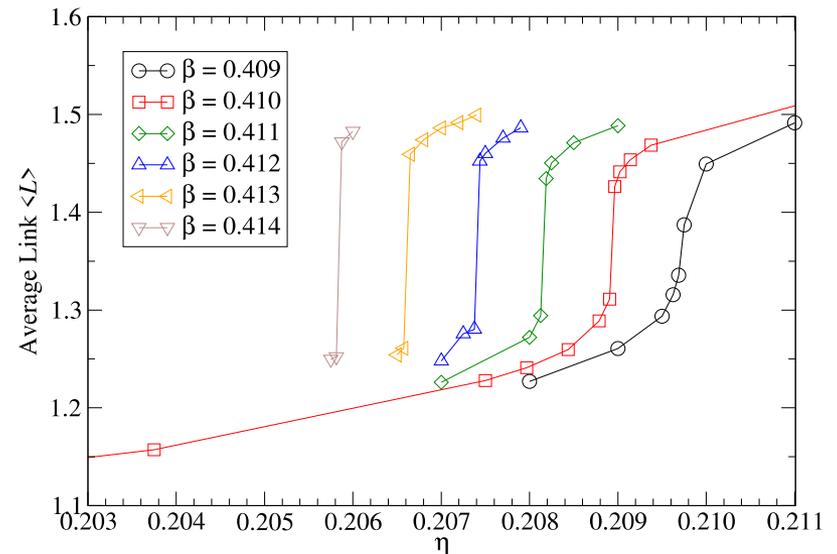


Gattringer-Schmidt, PRD86(2012)094506



SA+, JHEP10(2023)077

- First-order confinement-Higgs transition line and its endpoint are determined
- Critical exponents are comparable to the mean-field ones also at finite density

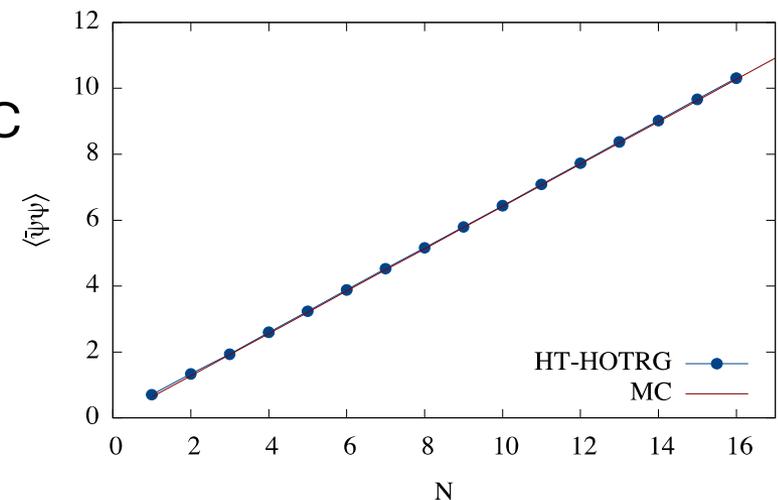
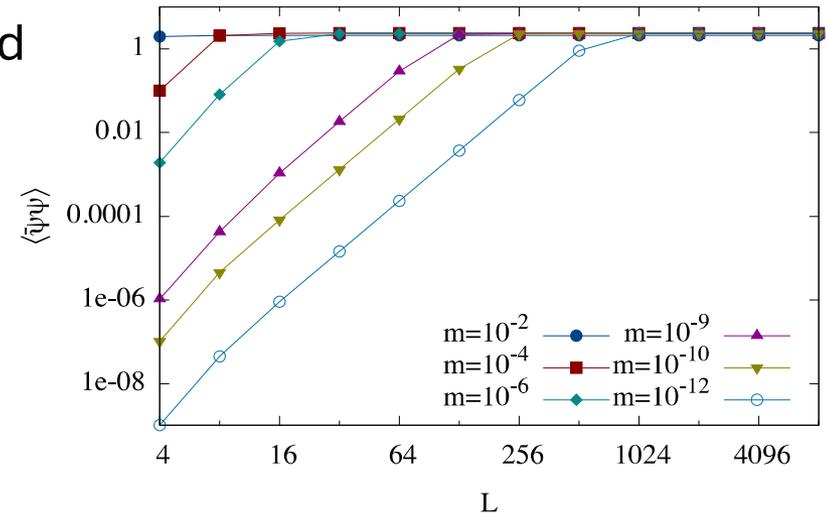


SA+, JHEP10(2023)077

# Infinite-coupling U(N) model w/ TRG

Milde+, Lattice2021

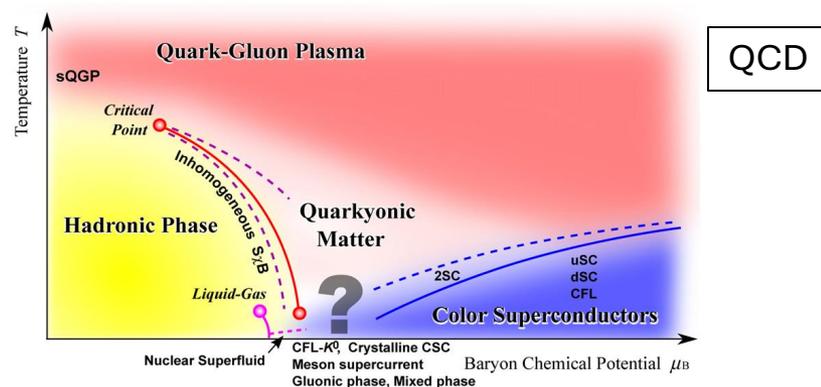
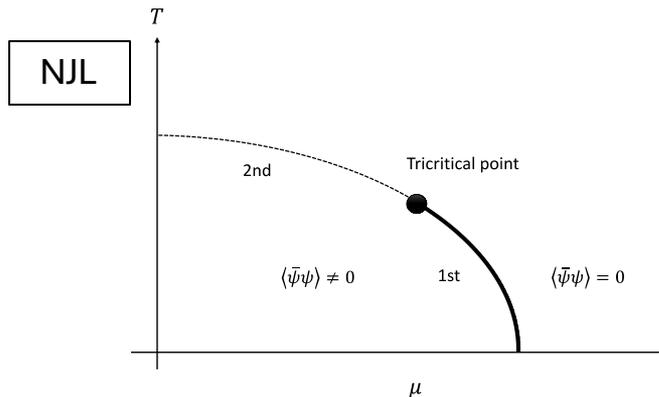
- Investigation of chiral symmetry breaking
  - Staggered fermion theory is reformulated as a dimer-monomer system
  - Infinite-volume limit and chiral limit
  - Chiral symmetry seems to be spontaneously broken in these limits
- Comparison with the MC simulation
  - Chiral condensate in the large-N limit
  - Difference is less than 1% btw TRG and MC



	$\lim_{N \rightarrow \infty} \frac{\langle \bar{\psi}\psi \rangle}{N}$
HT-HOTRG (D=20)	0.637(2)
Metropolis	0.64279(1)

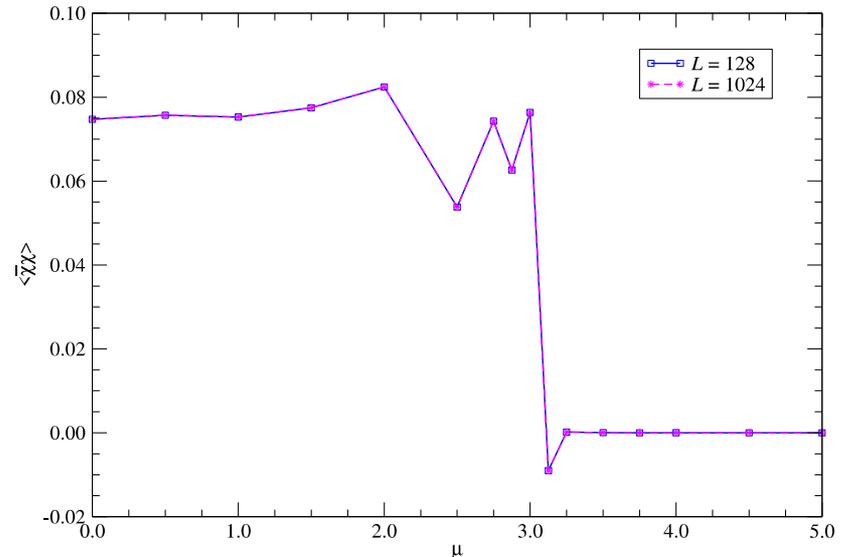
# Nambu-Jona-Lasinio model w/ TRG

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



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

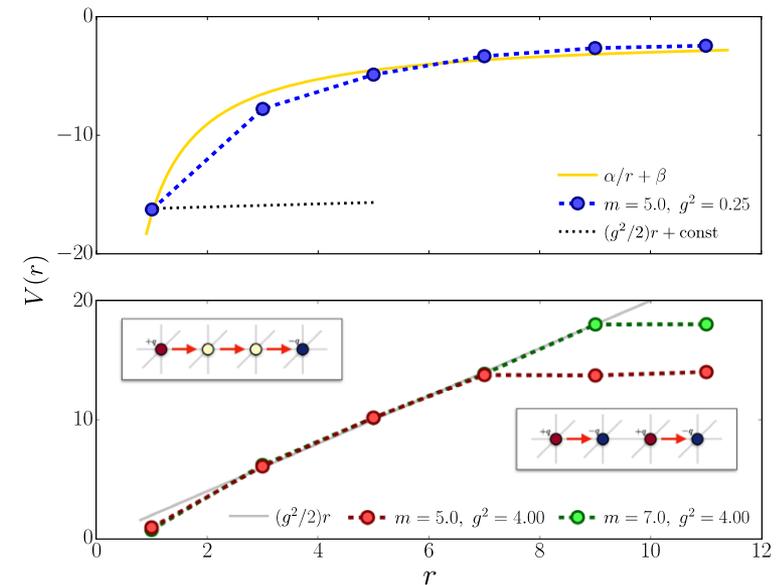
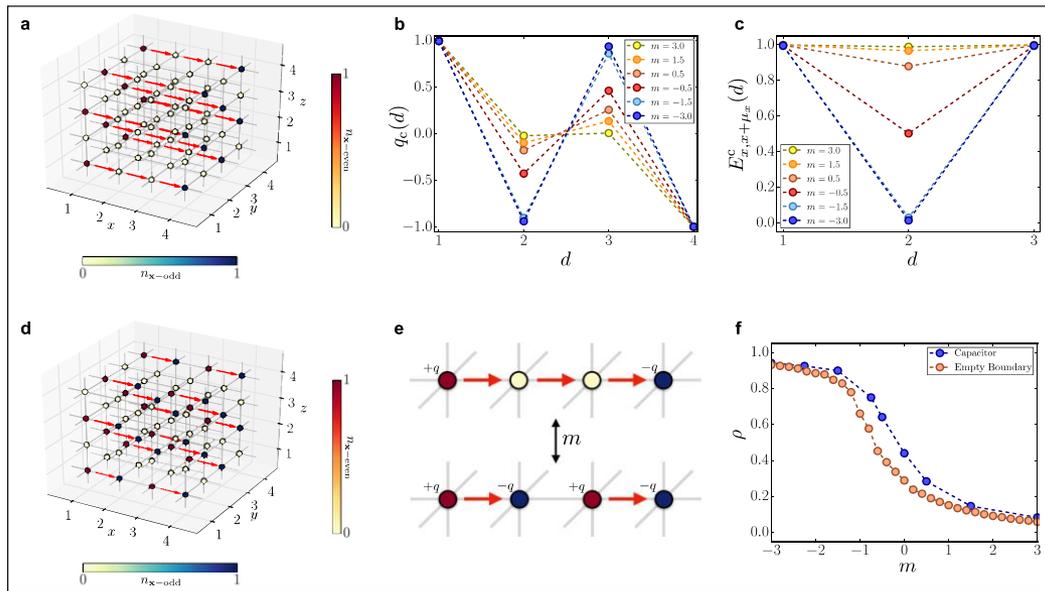
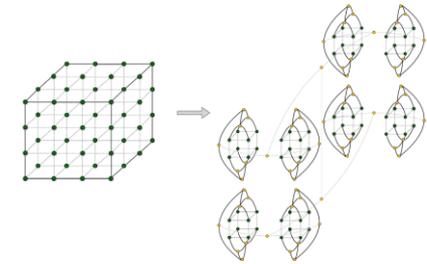
- **TRG has confirmed that the chiral symmetry is restored in the cold dense regime, where the MC is hindered by the severe sign problem**
- Pressure and number density have also been obtained



# QED w/ TTN

Magnifico+, Nat. Commun.12(2021)3600

- The first TTN simulation of the ground state of the (3+1)D compact QED
- Confinement properties are investigated
  - **Coulomb potential** in the weak coupling regime
  - **Linear potential** in the strong coupling regime



# Status of TN in the higher dimensions

- TRG, TNS, and GGPEPS have been applied to the 3D, (2+1)D systems
  - Starting from the simplest spin models and proceedings to applications to non-Abelian gauge theories
  - Relatively large bond dimensions are available in TRG and TTN
- TRG algorithms are most employed in numerical computations of 4D, (3+1)D systems
  - Since the tensor contraction is the bottleneck in several TRG algorithms, parallelization can reduce the execution time
- Parallel computing methods specialized for individual algorithms are being developed

SA-Kuramashi-Yamashita-Yoshimura, Lattice2019

Sakurai-Yamashita, CPC278(2022)108423

Sun-Shirakawa-Yunoki, PRB110(2024)08514

Magnifico-Cataldi-Rigobello-Majcen-Jaschke-Silvi-Montangelo, arXiv:2407.03058

# Future perspectives

- The Hamiltonian- and Lagrangian-based TN algorithms share the problem of how to regularize or deal with the **non-Abelian DoFs**
  - Not only in classical TN computations but also in quantum computations. There is potential for mutual development
  - GGPEPS is providing a new approach toward this issue
- Need to develop the schemes to analyze numerical results that include **finite bond dimension effect**
  - Lessons form conformal field theories
- New TN algorithms by combining other methods
  - TN + Machine Learning
  - TN + Monte Carlo
    - From the systematic error to statistical one

Tagliacozzo-Oliveira-Iblisdir-Latorre, PRB78(2008)024410

Pollmann-Mukerjee-Turner-Moore, PRL102(2009)255701

Ueda-Oshikawa, PRB108(2023)024413

Huang-Chan-Kao-Chen, PRB107(2023)205123

Liao-Liu-Wang-Xiang, PRX9(2019)031041

Chen-Gao-Guo-Liu-Zhao-Liao-Wang-Xiang-Li-Xie, PRB101(2020)220409

Jha-Samlodia, CPC294(2024)108941

Ferris, arXiv:1507.00767

Huggins-Freeman-Stoudenmire-Tubman-Whaley, arXiv:1710.03757

Zohar-Cirac, PRD97(2018)034510

Arai-Ohki-Takeda-Tomii, PRD107(2023)114515

Todo, 18<sup>th</sup> Extreme Universe Colloquium (2023)

Chen-Guo-Zhang-Zhang-Deng, arXiv:2409.06538