



# Recent progress in the tensor renormalization group

Daisuke Kadoh (Doshisha Univ.)

LATTICE2021:

The 38<sup>th</sup> International Symposium  
on Lattice Field Theory (online)

July 30, 2021

# Cases with the sign problem

---

finite density QCD

*early universe, neutron star,..*

chiral gauge theory

*The SM, GUT,..*

supersymmetry

*AdS/CFT, string theory,...*

$\theta$ -vacuum

*strong CP problem*

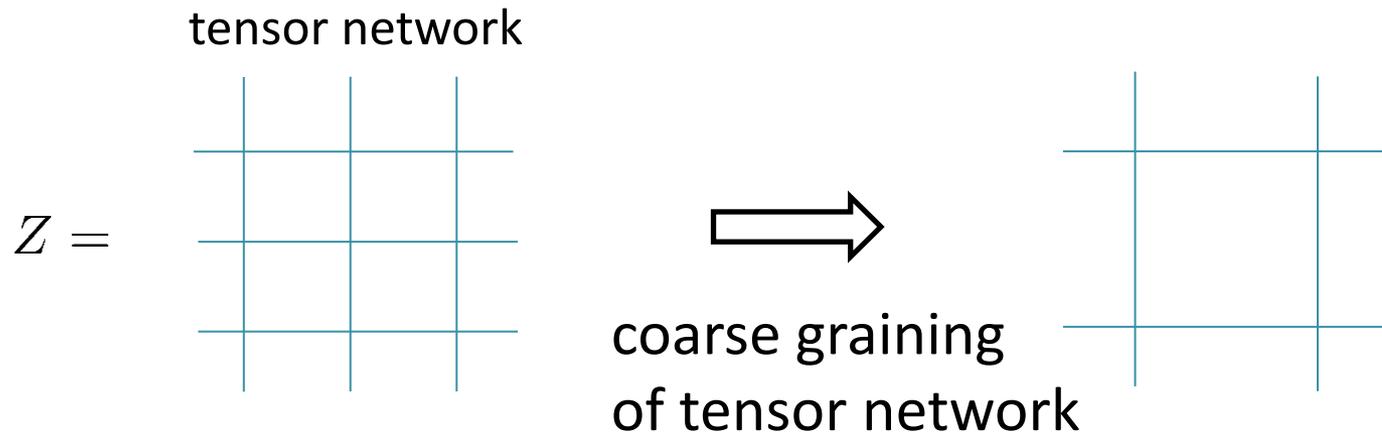
real time simulation

*Schwinger-Keldysh formalism*

It is important to solve the sign problem.

# Tensor renormalization group (TRG)

[Levin-Nave, 2007]



**no statistical process & no sign problem**

Previous tensor network (TN) studies in field theory:

Kuramashi, Takeda, Meurice, Jansen, Banuls, D. C.-J. Lin, Catterall,  
Unmuth-Yockey, Bazavov, Sakai, Yoshimura, Jha, Oba, Akiyama,  
Nakayama, Fukuma, Matsumoto,...

c.f. improved MC method:

reweighting method, complex Langevin, Lefschetz thimble, ...

# Features of TRG

---

(1) no sign problem, no statistical errors

(2) systematic error from finite  $D_{cut}$

(3) partition function is directly calculable

(4) computational cost is  $\log(V) \times D_{cut}^p$

easy to take the thermodynamic limit

large internal DOF or higher dimensions

→ high cost

It may be possible to calculate parameters that the MC method is not good at.

# TRG approach to field theory

---

1. fermions

2. scalars

3. gauge fields

4. algorithms  
for  $d=3,4$

5. large internal DOF  
( $N_c, N_f \gg 1$ )

EASY

HARD

fermions  
 $U(1), SU(2)$

$\approx$

2

$\gg$

4

$\gg$

$SU(N)$   
( $N > 2$ )

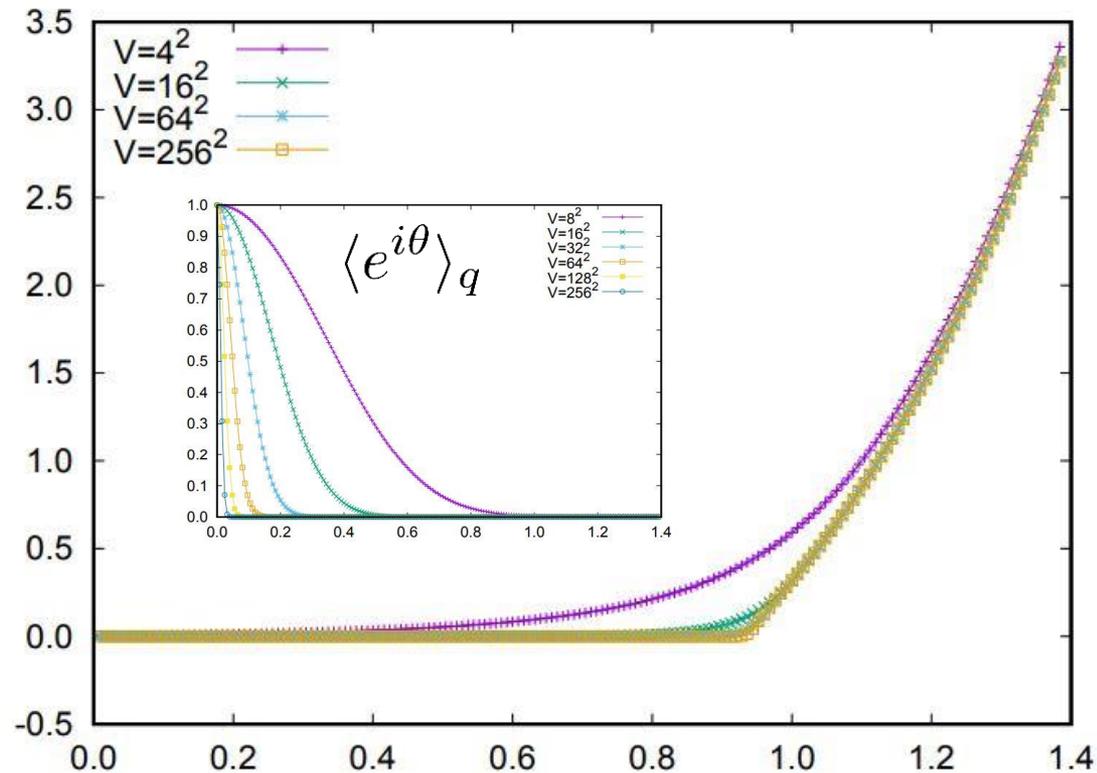
$\gg$

5

# 2D scalar field theory at finite density

[D.K.-Kuramashi-Nakamura-Sakai-Takeda-Yoshimura, 2019]

$\langle n \rangle$



$$\lambda = 1$$

$$m^2 = 0.01$$

$$K = 64$$

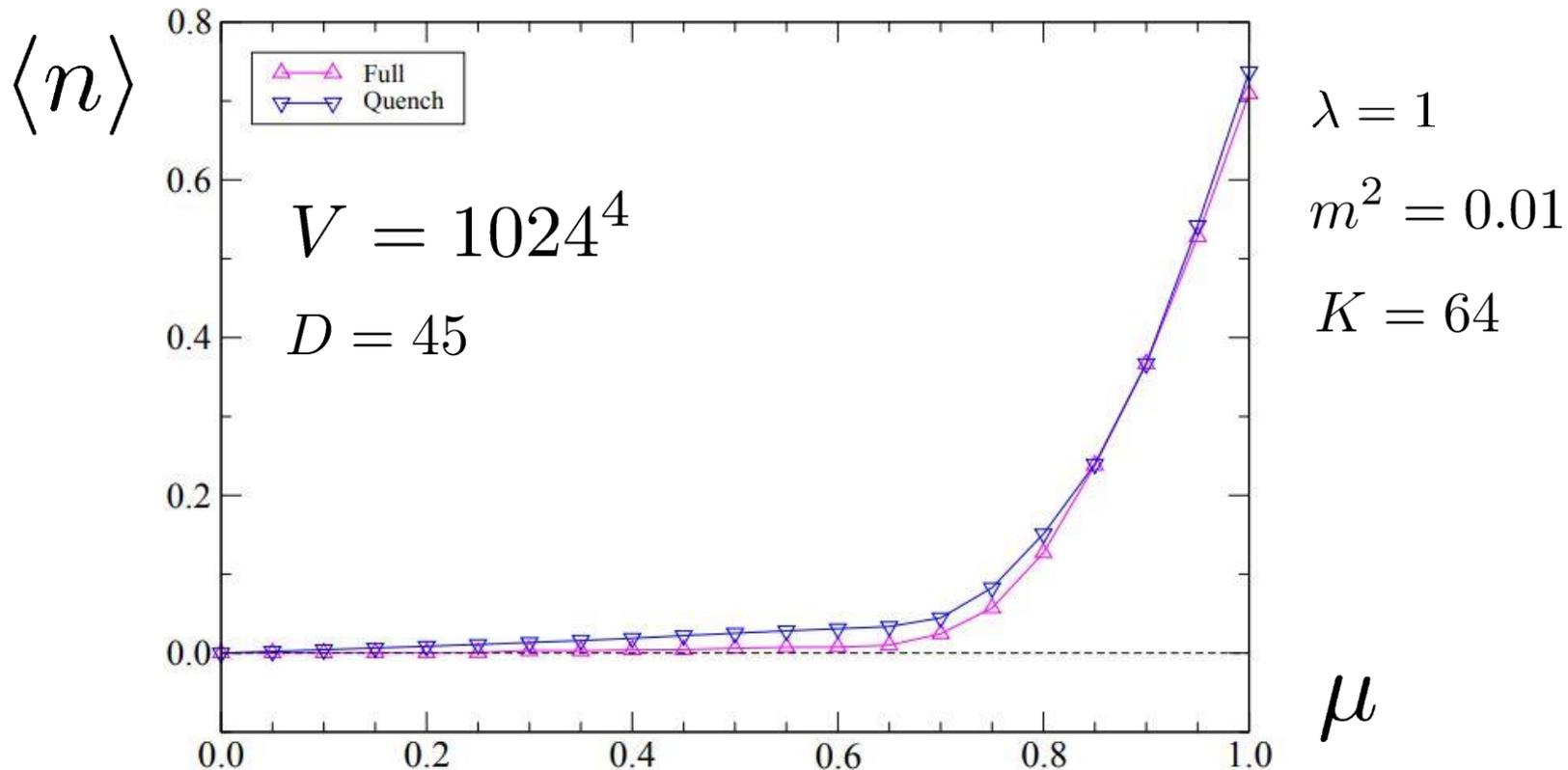
$$D_{cut} = 64$$

$\mu$

Silver Blaze phenomena is clearly observed for large volume lattices.

# 4D scalar field theory at finite density

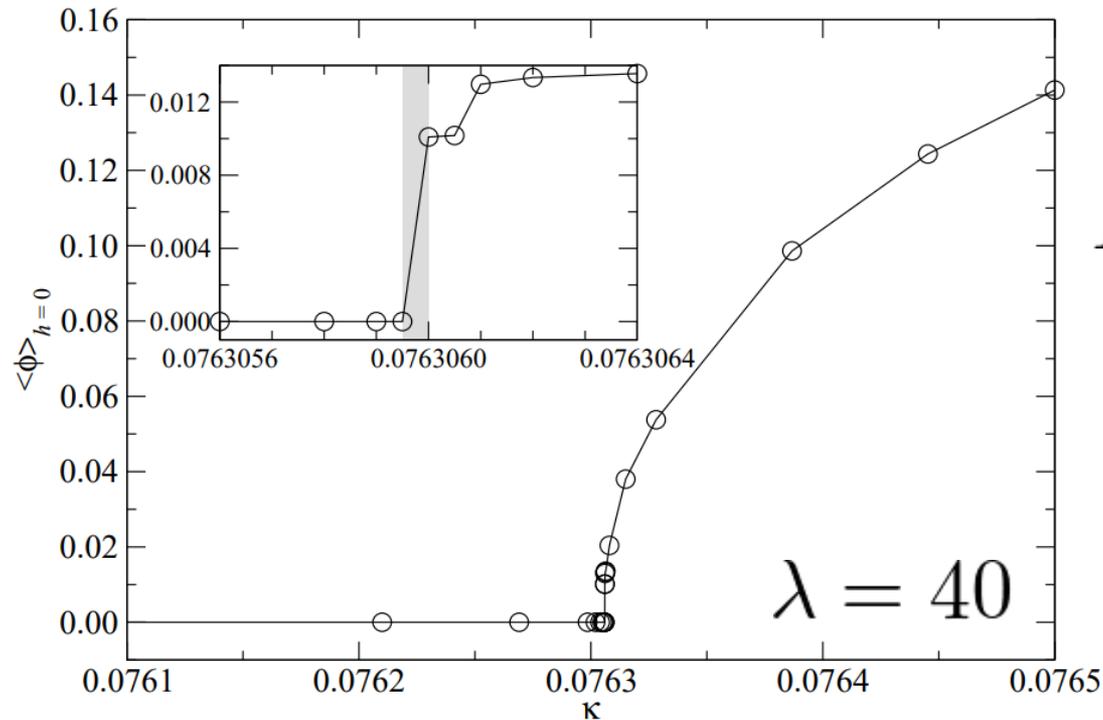
[Akiyama-DK-Kuramashi-Yamashita-Yoshimura, 2020]



The number density obtained on  $V=1024^4$ (!) shows behavior like a constant (Silver blaze).

# 4D real scalar field theory

[Akiyama-Kuramashi-Yoshimura, 2021]



$$\kappa_c^{(ATRG)} = 0.0892625(375) \quad \lambda = 5$$

$$\kappa_c^{(MC)} = 0.08893(20) \quad [\text{Akerlund et al. 2013}]$$

The critical coupling constant is precisely obtained.

# TRG for fermions

---

- The Grassmann TRG [Gu et al. 2010]

c.f. Schwinger model (Shimizu-Kuramashi, 2014)  
Gross-Neveu model (Takeda-Yoshimura, 2014)

- A reformulation of GTRG [Akiyama-DK (2020), 2005.07570]

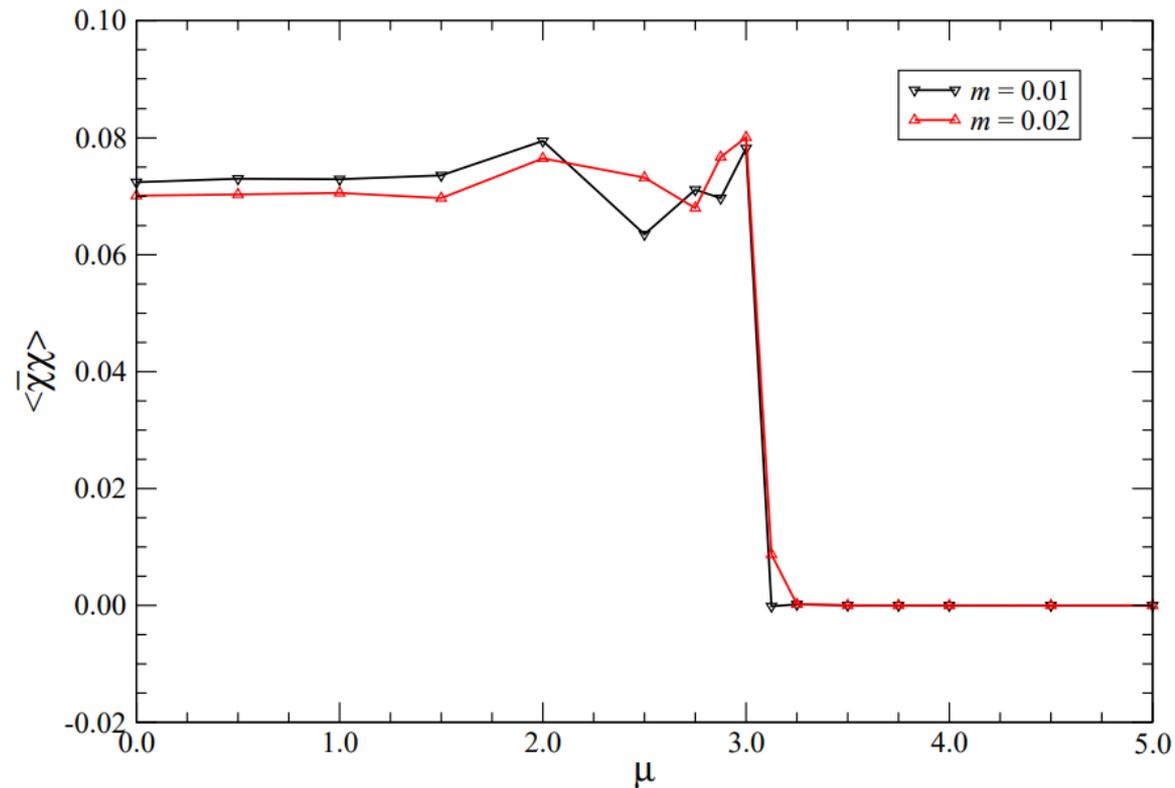
$$\mathcal{T}_{\psi_1\psi_2\psi_3\psi_4} = \sum_{i,j,k,l=0}^1 T_{ijkl} \psi_1^i \psi_2^j \psi_3^k \psi_4^l$$

Tensor network representations for general lattice fermions including Wilson fermions, staggered fermions, domain wall fermions, are obtained.

# 4D NJL model

[Akiyama-Kuramashi-Yamashita-Yoshimura, 2021]

$$V = 1024^4, D = 55$$



Computations with TRG have also become possible for 4D NJL.

# TRG for gauge theories

- character expansion

$$e^{\alpha \text{Re tr}(U)} = \sum_R d_R \lambda_R(\alpha) \chi_R(U)$$

- U(1) lattice theory

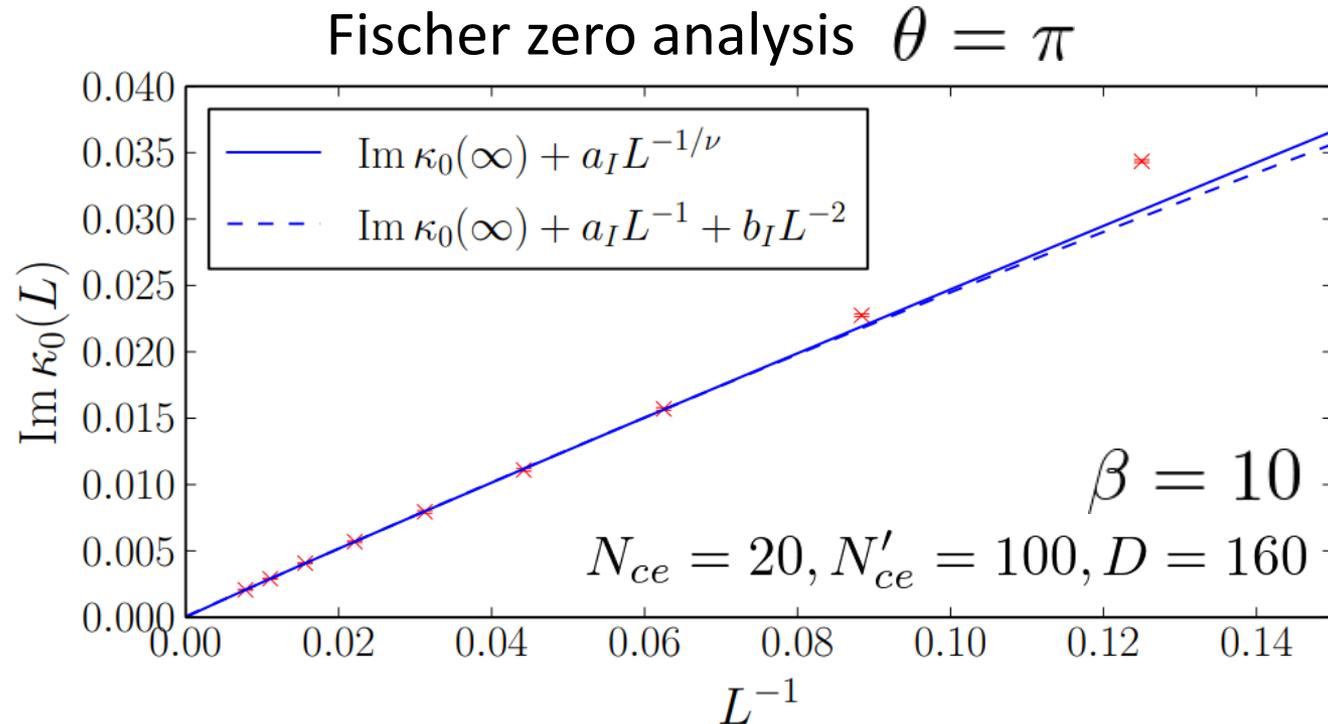
$$\begin{aligned} e^{\frac{1}{g^2} \cos(F_{12}(x))} &= \sum_{n=-\infty}^{\infty} I_n(1/g^2) e^{inF_{12}(x)} \\ &= \sum_{n=-\infty}^{\infty} I_n(1/g^2) e^{inA_2(x+\hat{1})} e^{-inA_2(x)} e^{-inA_1(x+\hat{2})} e^{inA_1(x)} \end{aligned}$$

$$\int dA_1 dA_2 \quad \Longrightarrow \quad Z = \text{Tr} \prod_n T_{i_n j_n i'_n j'_n}$$

- c.f. Schwinger model (Shimizu-Kuramashi, 2014)  
 CP(1) (Takeda-Kawauchi, 2016)  
 U(1) with  $\theta$ -term (Kuramashi-Yoshimura, 2019)

# Schwinger model with $\theta$ -term

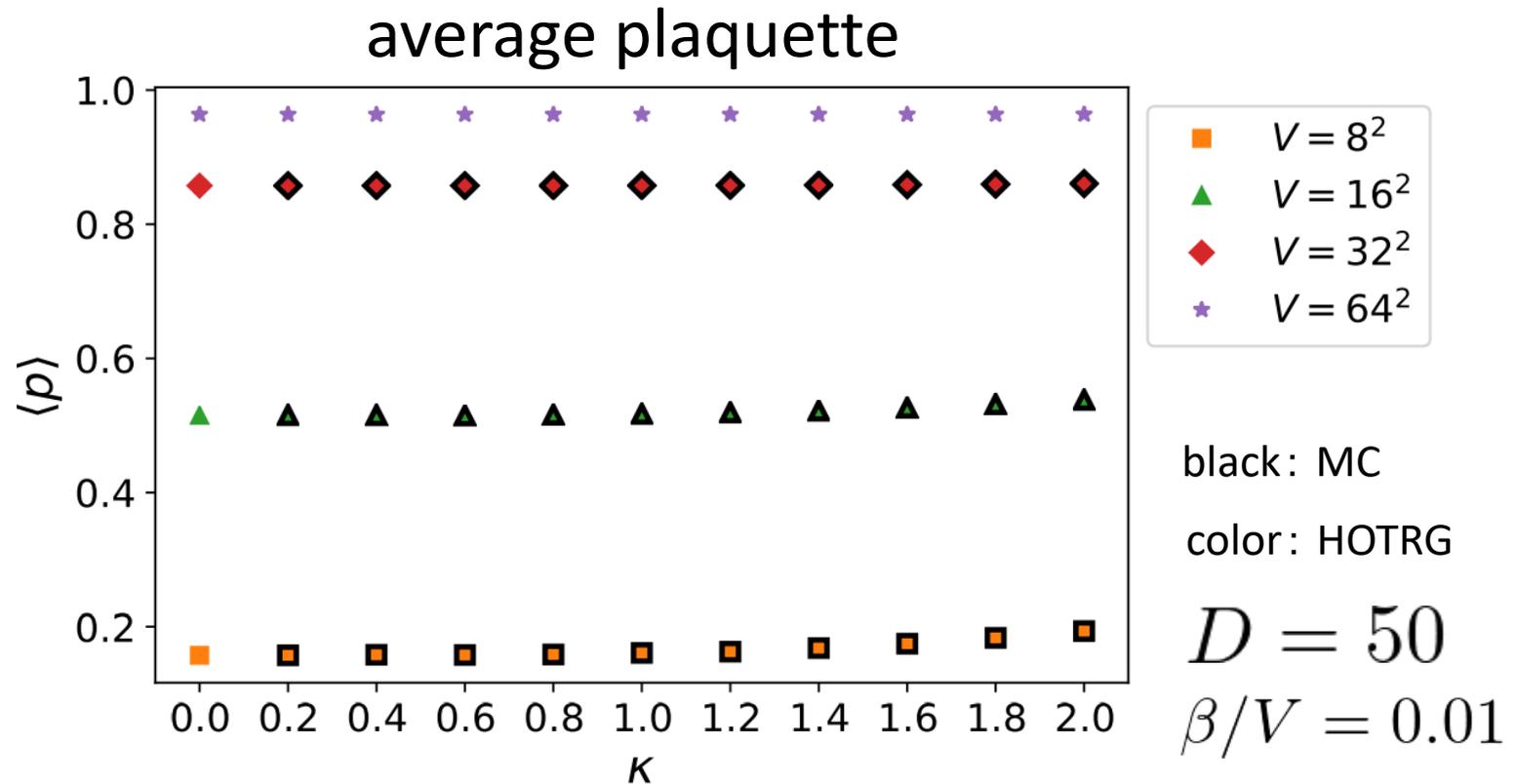
[Shimizu and Kuramashi, 2014]



The same critical exponent ( $\nu = 1$ ) as 2d Ising model is obtained.

# 2d SU(2) gauge-Higgs model ( $\lambda = \infty$ )

[Bazavov, Catterall, Jha, Unmuth-Yockey, 2019]



A tensor for SU(2) theory is defined by the CE  
The TRG method well reproduces the MC results.

# TN of 2d YM theory without the CE

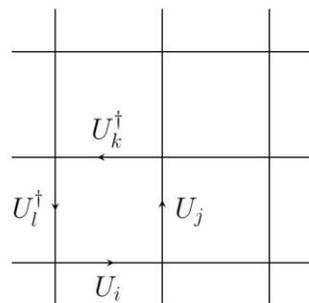
[Fukuma, DK and Matsumoto, arXiv: 2107.14149]

- group integrals are discretized by  $K$  random gauge fields  $\mathring{G} = \{U^{(1)}, U^{(2)}, \dots, U^{(K)}\}$  as

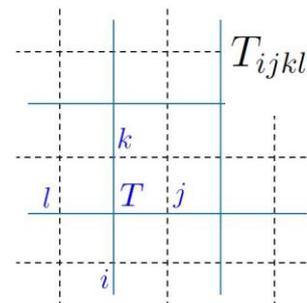
$$\int dU f(U) \approx \frac{1}{K} \sum_{i=1}^K f(U^{(i)})$$

- TN with finite bond dimension

$$Z = \int DU e^{-(\beta/N) \sum_n \text{Re tr}(1 - U_P(n))} \approx \text{Tr} \prod_{n \in \Gamma} T_{i_n j_n i'_n j'_n}$$



→



$$T_{ijkl} = \frac{1}{K^2} e^{-(\beta/N) \text{Re tr}(1 - U_i U_j U_k^\dagger U_l^\dagger)}$$

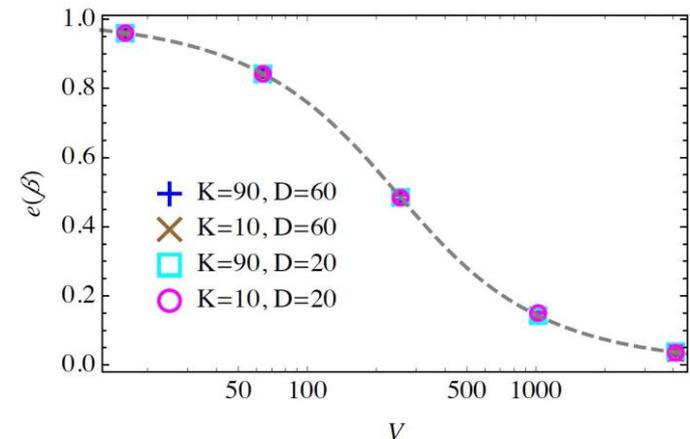
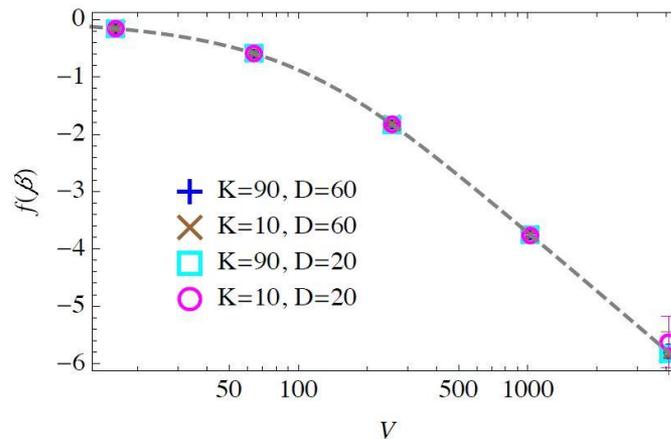
applicable for  
any gauge group  
w/o the CE

# SU(2)

[Fukuma, DK and Matsumoto, arXiv: 2107.14149]

$$f(\beta) = \frac{1}{V} \ln Z(\beta)$$

$$e(\beta) = -\frac{\partial}{\partial \beta} f(\beta)$$

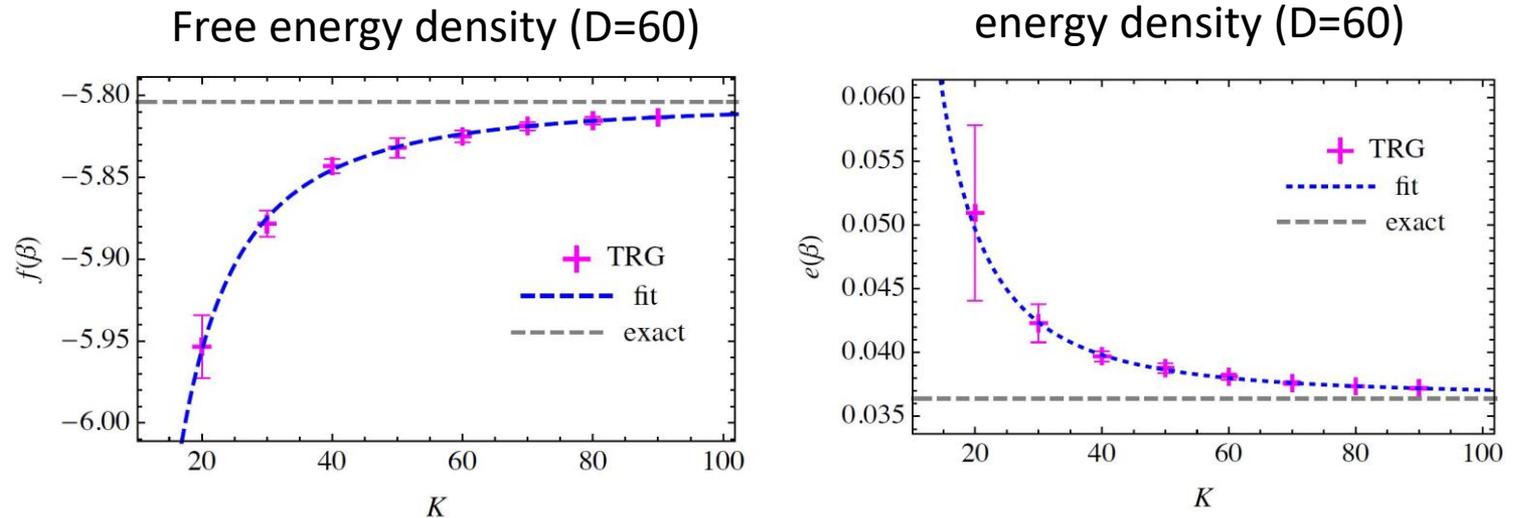


Numerical results of free energy density and energy density agree well with the exact values of 2d YM.

$$Z = \sum_R \lambda_R^V(\beta)$$

# SU(2): the large K limit

[Fukuma, DK and Matsumoto, arXiv: 2107.14149]



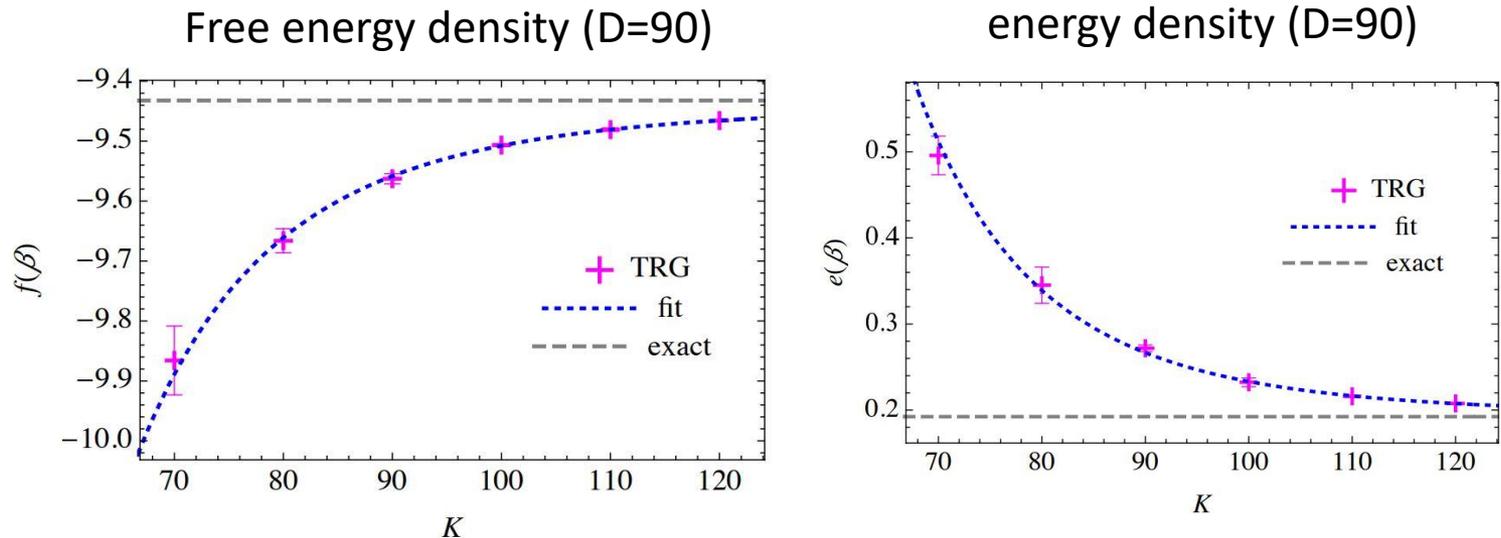
Fit results at D=60 by a fitting formula  $g(K) = \mu + \alpha K^{-p}$

	(exact)	$\mu$	$\alpha$	$p$	$\chi^2/\text{DOF}$
$f(\beta)$	-5.8040	$-5.8046^{+0.004}_{-0.003}$	$-43^{+26}_{-60}$	$1.88^{+0.27}_{-0.28}$	0.24
$e(\beta)$	0.03639	$0.03655^{+0.0005}_{-0.0003}$	$5^{+24}_{-4}$	$2.0^{+0.5}_{-0.5}$	0.11

Fit results at D=60 are close to the exact value.  
The extrapolation significantly improves the accuracy.

# SU(3): the large K limit

[Fukuma, DK and Matsumoto, arXiv: 2107.14149]



Fit results at D=90 by a fitting formula  $g(K) = \mu + \alpha K^{-p}$

	(exact)	$\mu$	$\alpha$	$p$	$\chi^2/\text{DOF}$
$f(\beta)$	-9.4323	$-9.4400^{+0.0019}_{-0.0043}$	$-0.3^{+0.2}_{-1.7} \times 10^{10}$	$5.31^{+0.44}_{-0.01}$	0.21
$e(\beta)$	0.1923	$0.1941^{+0.0017}_{-0.0008}$	$2.2^{+5.6}_{-1.6} \times 10^{10}$	$5.88^{+0.29}_{-0.01}$	1.18

Fit results at D=90 are close to the exact value.

Our TN representation for SU(3) properly works!

# TRG in higher dimensions

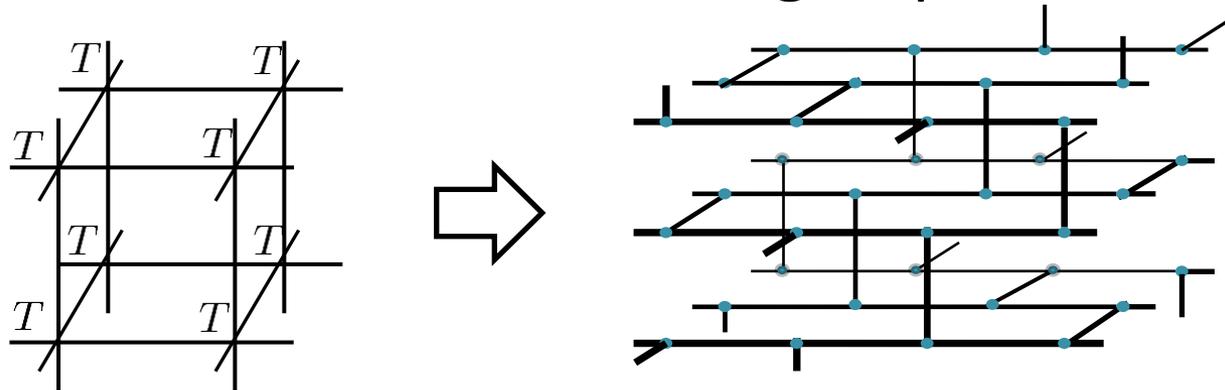
[DK-Nakayama (2019), 1912.02414] [DK-Oba-Takeda(2021), 2107.08769]

- hidden structure of a tensor

$$T_{ijklmn} = \sum_a W_{ai}^{(1)} W_{aj}^{(2)} W_{ak}^{(3)} W_{al}^{(4)} W_{am}^{(5)} W_{an}^{(6)} \quad (\text{for instance, } d=3)$$

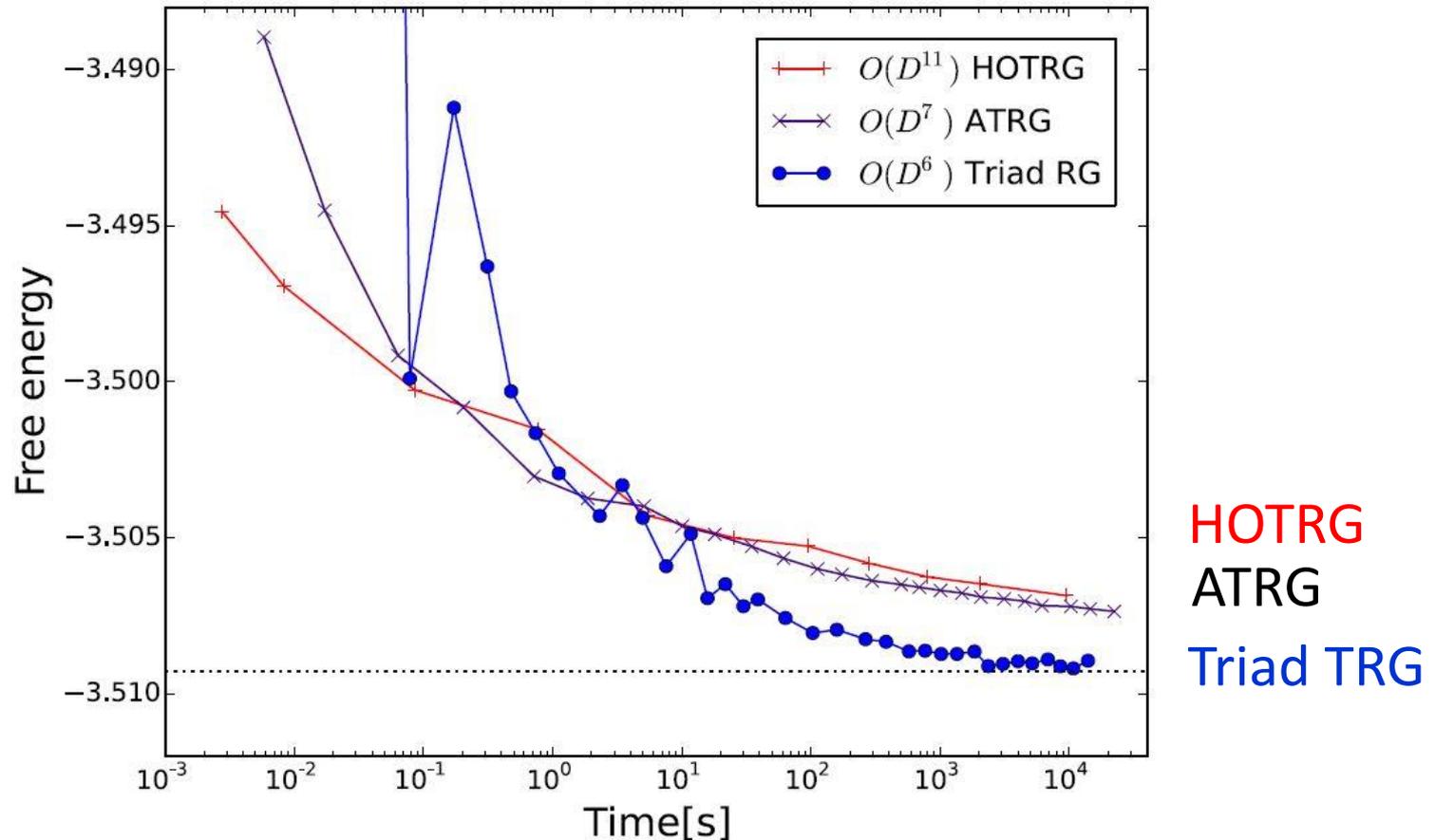
$$= \sum_{a,b,c} A_{ija} B_{akb} C_{blc} D_{cmn}$$

- triad tensor renormalization group



The computational cost of TRG is naturally reduced on transformed networks made only of rank-3 tensor.

# Numerical tests on 3D Ising model



The triad TRG method show a better performance in 3D Ising model.

# Current status (2021/7/30) and future issues

---

fermions  
OK

gauge fields

OK:  $U(1)$ ,  $SU(2)$ ,  
 $SU(3)$  ( $d=2$ )

For  $SU(3)$  in  $d=3$  and  $4$ ,  
some ideas are needed.

scalar fields

basically OK

... but improvements of  
numerical integrations  
are needed.

good algorithms in  $d=3,4$

ATRG, triad TRG( $d=3$ ), ...

many issues such as efficient  
algorithms, transformed TN, ....

large internal DOF  
(including QCD)

many tasks, and the difficulty  
level is high. There may be  
great progress within 5 years(?)

it seems to be related to the  
development of quantum  
computers.

Thank you!