



“Tensor renormalization group study of (1+1)-dimensional $O(3)$ nonlinear sigma model”

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The 1st TCHoU member meeting in 2024, July 2, 2024



Plan of talk

- Introduction to Tensor Renormalization Group(TRG)
- Application of TRG to Quantum Field Theories(QFTs)
- Entanglement Entropy(EE) of (1+1)d O(3) NLSM at $\mu = 0$
- Quantum Phase Transition of (1+1)d O(3) NLSM at $\mu \neq 0$
- Summary and Outlook



Tensor Renormalization Group (TRG)

Levin-Nave

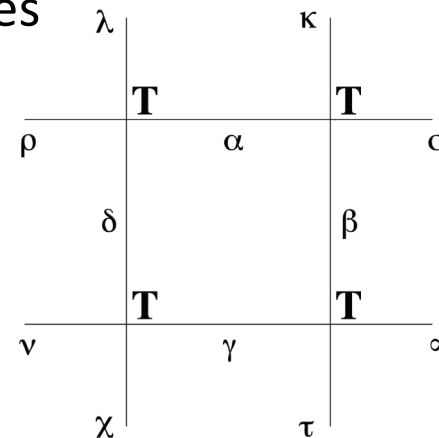
PRL99(2007)120601

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 representation

Details of model are specified in initial tensor

The algorithmic procedure is independent of models

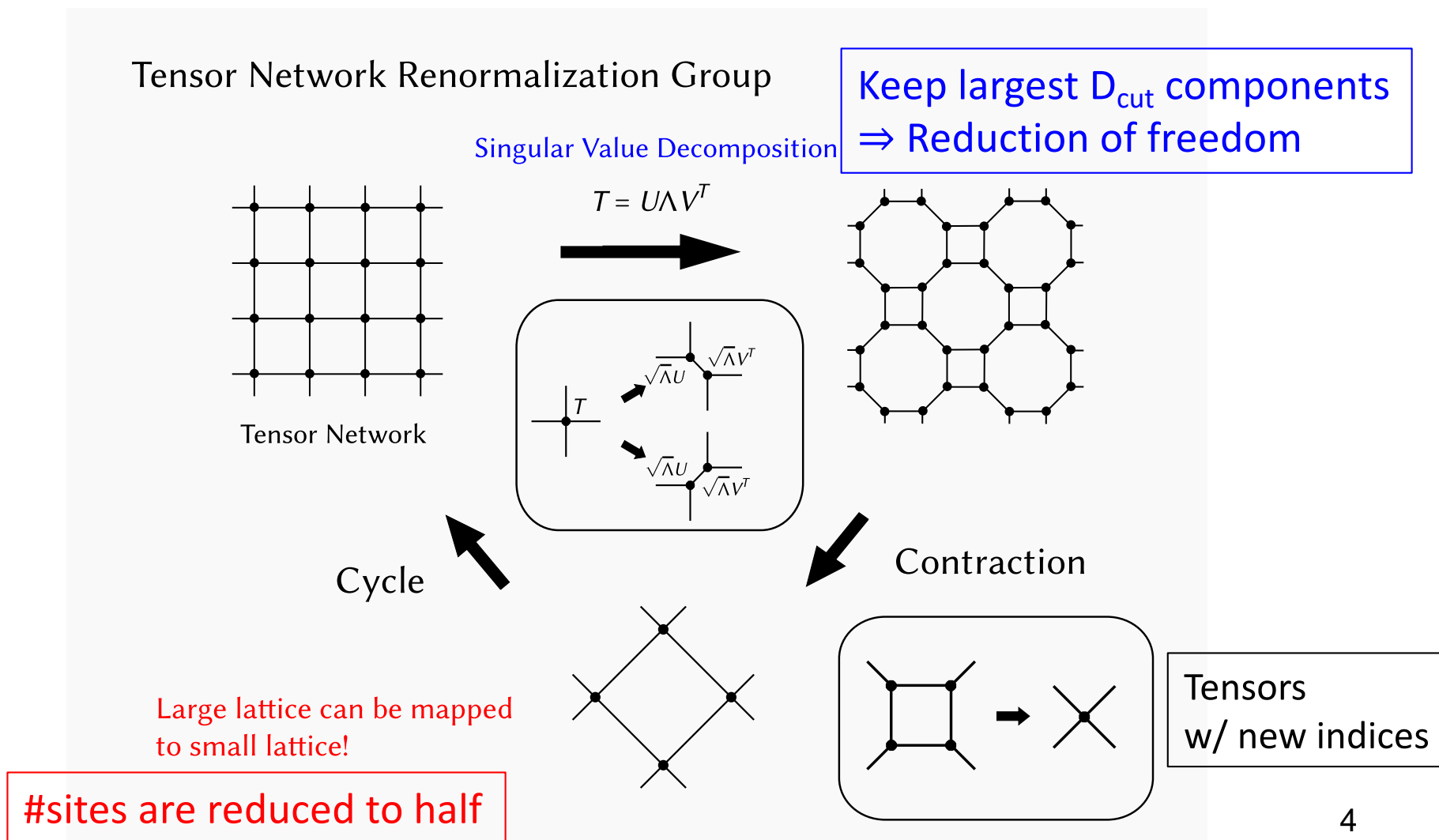
Of course, direct contraction is impossible for large N even with current fastest supercomputer

⇒ 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





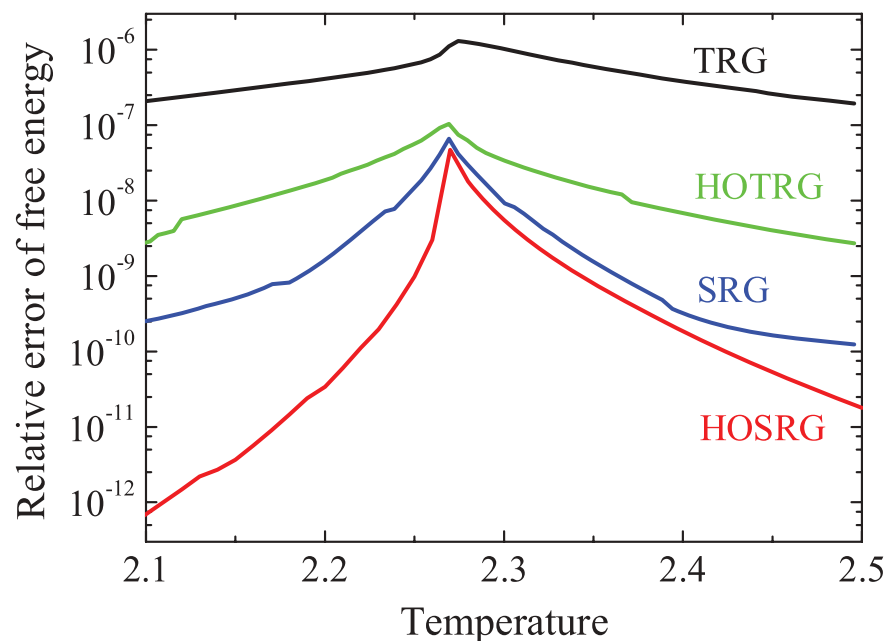
Numerical test for 2d Ising Model

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

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

Truncation error is controlled by the parameter D_{cut}

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

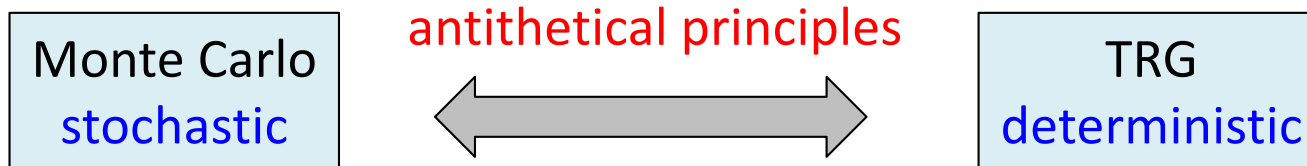


Xie et al.
PRB86(2012)045139

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



TRG vs Monte Carlo

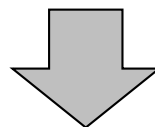


Advantages of TRG

- Free from sign problem/complex action problem in MC method

$$Z = \int \mathcal{D}\phi \exp(-S_{\text{Re}}[\phi] + iS_{\text{Im}}[\phi])$$

- Computational cost for L^D system size $\propto D \times \log(L)$
- Direct manipulation of Grassmann numbers
- Direct evaluation of partition function Z (density matrix ρ) itself



Applications in particle physics:

Finite density QCD, QFTs w/ θ -term, Lattice SUSY etc.

Also, in condensed matter physics

Hubbard model (Mott transition, High T_c superconductivity) etc.



TRG Approaches to QFTs (1)

■ w/ sign problem

2d models

CP(1) model w/ θ -term: Kawauchi-Takeda, EPJWoC175(2018)11015

O(3) NLSM: Luo-YK, JHEP03(2024)020

Real ϕ^4 theory:

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

Kadoh-YK-Nakamura-Sakai-Takeda-Yoshimura, JHEP05(2019)184

Complex ϕ^4 theory at finite density:

Kadoh-YK-Nakamura-Sakai-Takeda-Yoshimura, JHEP02(2020)161

U(1) gauge theory w/ θ -term:

YK-Yoshimura, JHEP04(2020)089

Schwinger(2d QED), Schwinger w/ θ -term:

Shimizu-YK, PRD90(2014)014508, 074503, PRD97(2018)034502

Gross-Neveu model at finite density:

Takeda-Yoshimura, PTEP2015(2015)043B01

N=1 Wess-Zumino model (SUSY):

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

Application to models w/ sign problem,

Development of calculational methods for scalar, fermion and gauge fields



TRG Approaches to QFTs (2)

■ w/ sign problem

3d models

Z_2 gauge Higgs model at finite density: Akiyama-YK, JHEP05(2022)102

Real ϕ^4 theory: Akiyama-YK-Yoshimura, PRD104(2021)034507

Z_2 gauge theory at finite temperature: YK-Yoshimura, JHEP08(2019)023

4d models

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

Complex ϕ^4 theory at finite density:

Akiyama-Kadoh-YK-Yamashita-Yoshimura, JHEP09(2020)177

NJL model at finite density:

Akiyama-YK-Yamashita-Yoshimura, JHEP01(2021)121

Real ϕ^4 theory: Akiyama-YK-Yoshimura, PRD104(2021)034507

Z_2 gauge Higgs model at finite density: Akiyama-YK, JHEP05(2022)102

Z_3 gauge Higgs model at finite density: Akiyama-YK, JHEP10(2023)077

⇒ Research target is shifting from 2d models to 4d ones



TRG Approaches to QFTs (3)

■ w/ sign problem

Condensed matter physics

Similarity btw Hubbard models and NJL ones

Action consisting of hopping terms and 4-fermi interaction term

$$S = \sum_{n \in \Lambda_{d+1}} \epsilon \left\{ \bar{\psi}(n) \left(\frac{\psi(n + \hat{\tau}) - \psi(n)}{\epsilon} \right) - t \sum_{\sigma=1}^d (\bar{\psi}(n + \hat{\sigma}) \psi(n) + \bar{\psi}(n) \psi(n + \hat{\sigma})) + \frac{U}{2} (\bar{\psi}(n) \psi(n))^2 - \mu \bar{\psi}(n) \psi(n) \right\}$$

First principle calculation at finite density

(1+1)d Hubbard model: Akiyama-YK, PRD104(2021)014504

(2+1)d Hubbard model: Akiyama-YK-Yamashita, PTEP2022(2022)023101

In this talk we focus on (1+1)d O(3) NLSM

Entanglement Entropy (EE) at $\mu = 0$

Direct evaluation of partition function Z (density matrix ρ) itself

Quantum phase transition at $\mu \neq 0$

Free from sign problem/complex action problem

Determination of dynamical critical exponent z



EE of (1+1)d O(3) NLSM at $\mu = 0$

Luo-YK, JHEP03(2024)020

(1+1)d lattice O(3) NLSM (**asymptotic free**)

$$Z = \int \mathcal{D}[\mathbf{s}] e^{-S}$$
$$S = -\beta \sum_{n \in \Lambda_{1+1, \nu}} \mathbf{s}(n) \cdot \mathbf{s}(n + \hat{\nu})$$

$$\mathbf{s}^T(\Omega) = (\cos \theta, \sin \theta \cos \phi, \sin \theta \sin \phi)$$
$$\Omega = (\theta, \phi) \quad , \quad \theta \in (0, \pi], \quad \phi \in (0, 2\pi].$$

(θ, ϕ) is discretized w/ Gauss-Legendre quadrature \rightarrow TN representation

Entanglement Entropy (EE)

Whole system ($V=2L \times Nt$) is divided to subsystems A, B ($V_A, V_B=L \times Nt$)

von Neumann

$$S_A = -\text{Tr}_A \rho_A \log(\rho_A)$$

$$\rho_A = \frac{1}{Z} \text{Tr}_B [T \cdots T]$$

Rényi(n-th)

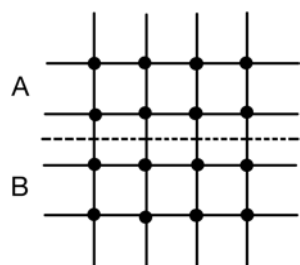
$$S_A^{(n)} = \frac{\ln \text{Tr}_A \rho_A^n}{1-n}$$



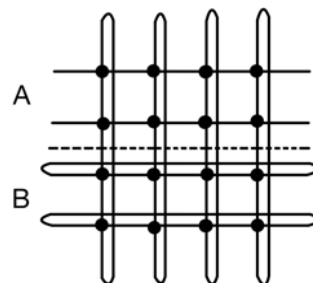
Calculation of EE

Luo-YK, JHEP03(2024)020

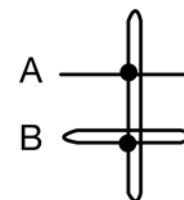
von Neumann EE



Divided into
subsystems A and B

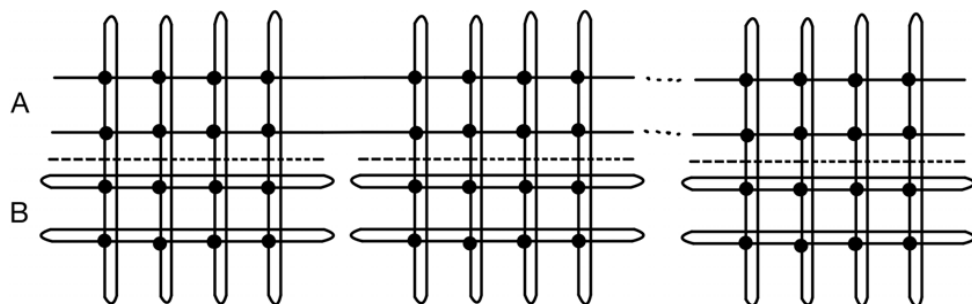


Trace out in terms of
subsystem B (Tr_B)

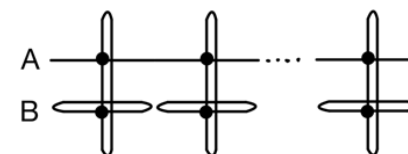


Coarse-graining
w/ HOTRG

n-th Rényi EE



Tr_B for subsystem B on each sheet of
n- times copied system



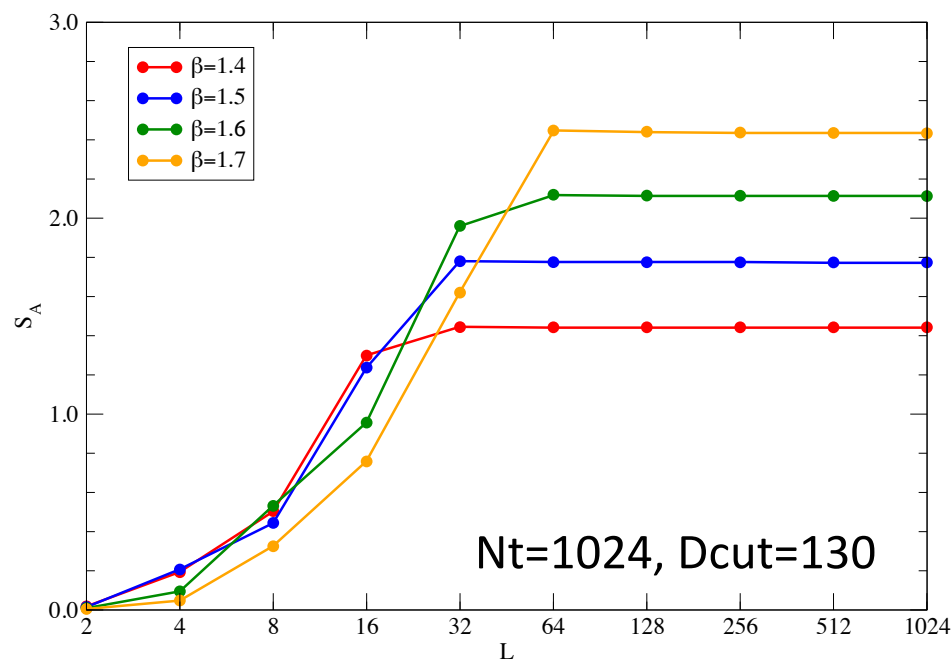
Coarse-graining
w/ HOTRG



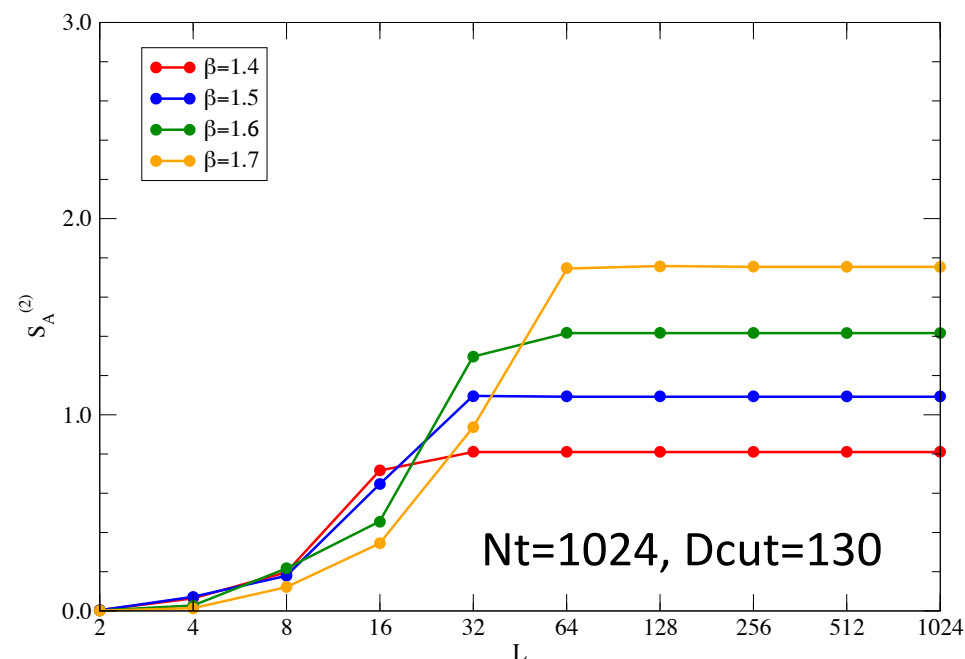
Spatial size (L) dependence of EE

Luo-YK, JHEP03(2024)020

von Neumann EE



2nd Rényi EE



$$S_A \sim \frac{c}{3} \ln(\xi) \quad (c: \text{central charge}, \xi: \text{correlation length}) \quad S_A^{(2)} \sim \frac{c}{3} \left(1 + \frac{1}{2}\right) \ln(\xi)$$

Convergence at $L \gg \xi$ is confirmed

β	1.4	1.5	1.6	1.7
ξ	6.90(1)	11.09(2)	19.07(6)	34.57(7)

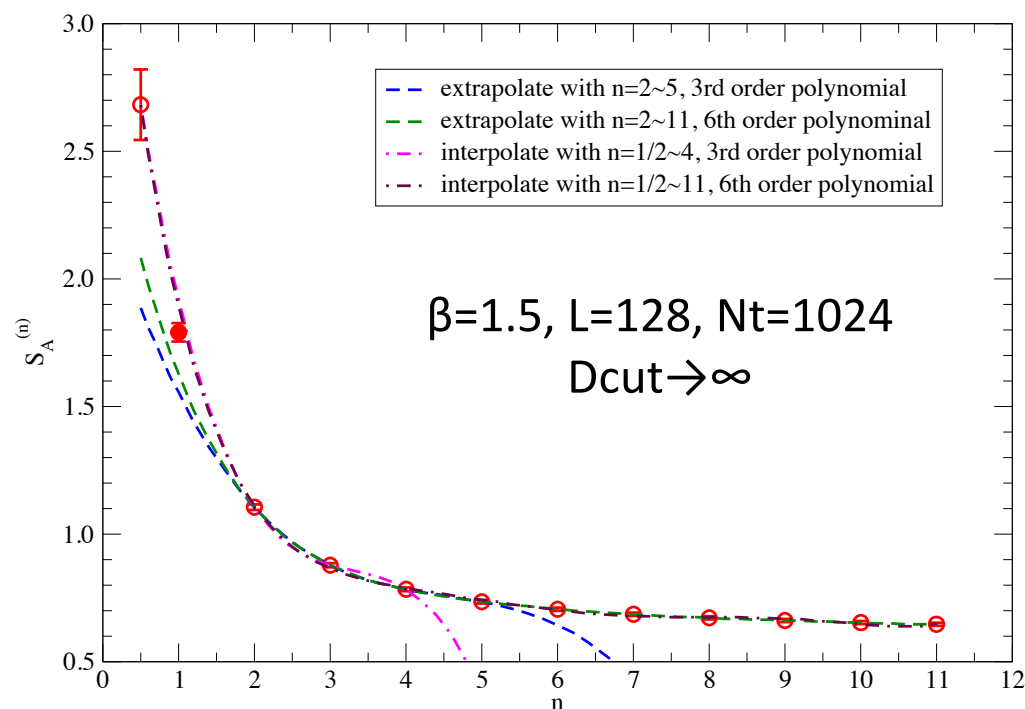
Wolff,
NPB334(1990)581



von Neumann vs Rényi

Luo-YK, JHEP03(2024)020

Comparison btw von Neumann EE($n=1$) and Rényi EE($n \neq 1$)



$S_A^{(2)}$ is not a good approximation of von Neumann EE($n=1$)

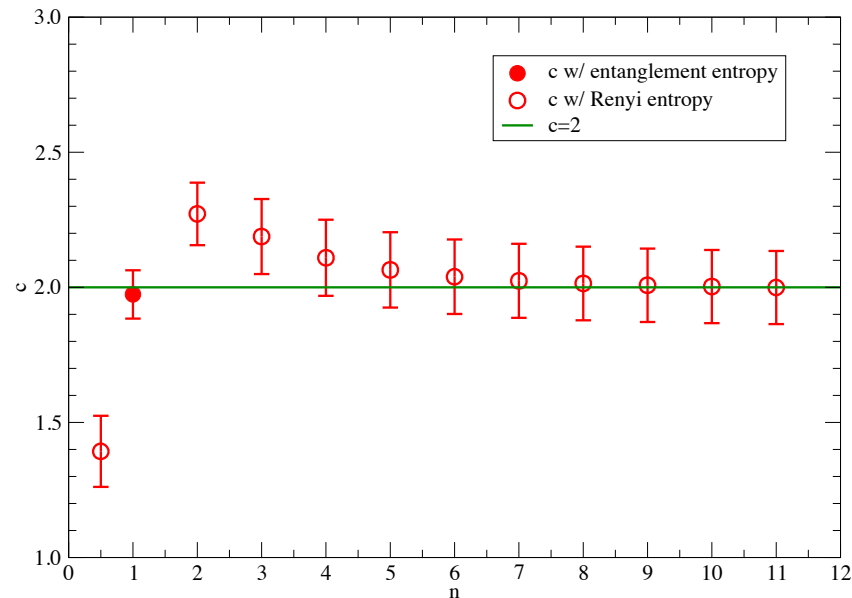
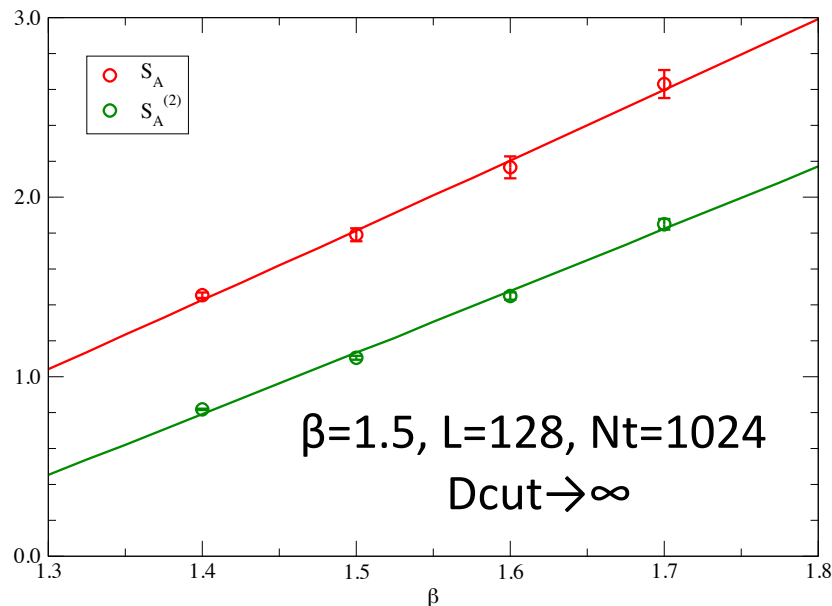
Difficult to extrapolate $S_A^{(n)}$ ($n \geq 2$) to $n=1$ at high precision

Reliable interpolation to $n=1$ using $S_A^{(1/2)}$ and $S_A^{(n)}$ ($n \geq 2$)



Central Charge

Luo-YK, JHEP03(2024)020



mass gap(two loop): $m = \frac{8}{e} \Lambda_{\overline{MS}} = 64\Lambda_L = \frac{128\pi}{a} \beta \exp(-2\pi\beta)$

von Neumann EE: $S_A = \frac{c}{3} (2\pi\beta - \ln \beta) + \text{const.}$

n-th Rényi EE: $S_A^{(n)} = \frac{c}{6} \left(1 + \frac{1}{n}\right) (2\pi\beta - \ln \beta) + \text{const.}$

central charge is determined from β dependence

$c=1.97(9)$ (von Neumann EE)

consistent btw different methods

$c=2.04(4)$ by Matrix Product State (MPS)

Bruckmann+, PRD99(2019)074501

$c \sim 2$ by finite size spectrum w/ TNR

Ueda+, PRE106(2022)014104



Quantum phase transition at $\mu \neq 0$

Luo-YK, arXiv:2406.08865

(1+1)d lattice O(3) NLSM at $\mu \neq 0$

$$Z = \int \mathcal{D}[\mathbf{s}] e^{-S}$$
$$S = -\beta \sum_{n \in \Lambda_{1+1}, \nu} \sum_{\lambda, \gamma=1}^3 s_\lambda(\Omega_n) D_{\lambda\gamma}(\mu, \hat{\nu}) s_\gamma(\Omega_{n+\hat{\nu}})$$

$$D(\mu, \hat{\nu}) = \begin{pmatrix} 1 & & & \\ & \cosh(\delta_{2,\nu}\mu) & -i \sinh(\delta_{2,\nu}\mu) & \\ & i \sinh(\delta_{2,\nu}\mu) & \cosh(\delta_{2,\nu}\mu) & \\ & & & \end{pmatrix} \Rightarrow \text{complex action}$$

$$\mathbf{s}^T(\Omega) = (\cos \theta, \sin \theta \cos \phi, \sin \theta \sin \phi)$$

$$\Omega = (\theta, \phi) \quad , \quad \theta \in (0, \pi], \quad \phi \in (0, 2\pi].$$

(θ, ϕ) is discretized w/ Gauss-Legendre quadrature \rightarrow TN representation

Symmetry btw spatial and temporal directions is broken by μ

\Rightarrow Spatial correlation length (ξ) \neq Temporal correlation length (ξ_t)

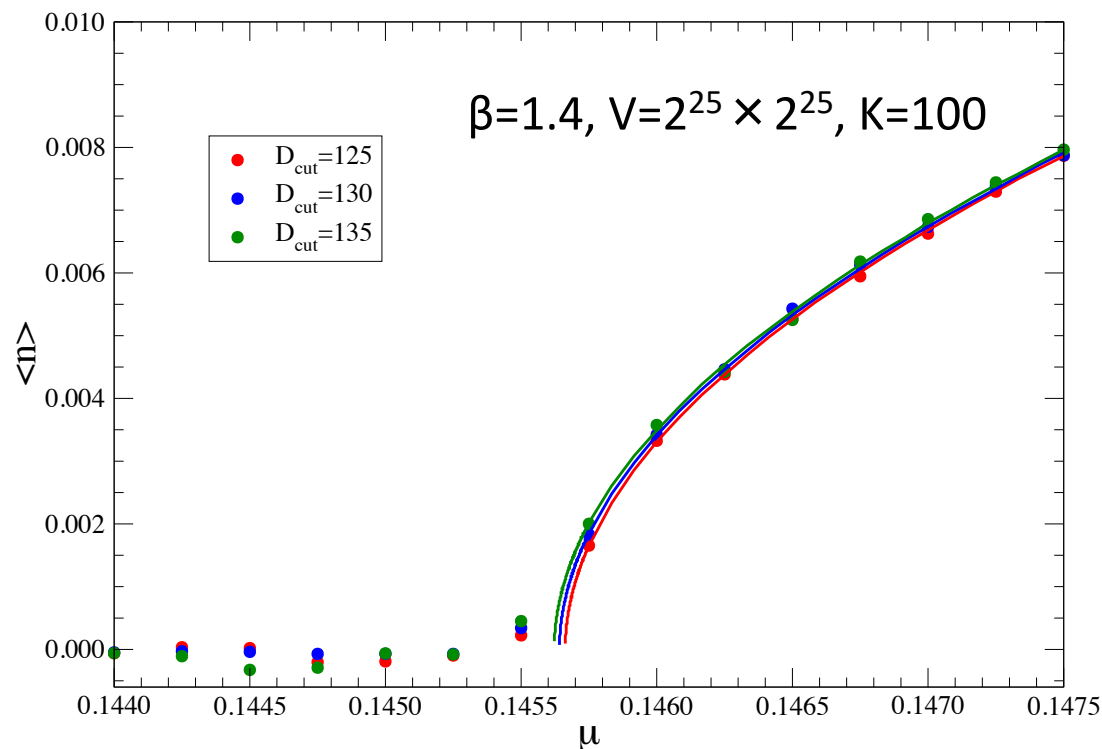
$$\xi_t = \xi^z \text{ with } z \text{ dynamical critical exponent}$$



Number Density

Luo-YK, arXiv:2406.08865

$$\text{number density: } \langle n \rangle = \frac{\partial}{\partial \mu} f \approx \frac{-1}{LN_t} \frac{\ln Z(\mu + \Delta\mu) - \ln Z(\mu - \Delta\mu)}{2\Delta\mu}$$



Simultaneous fit with $\langle n \rangle(\mu, D_{\text{cut}}) = A_n \cdot \{\mu - (\mu_c + B_n/D_{\text{cut}})\}^\nu$

$$\Rightarrow \nu = 0.512(15), \mu_c = 0.14512(11)$$

μ_c is consistent with mass gap $m=0.1449(2)$ at $\mu = 0$

Wolff,
NPB334(1990)581



Temporal Correlation Length (1)

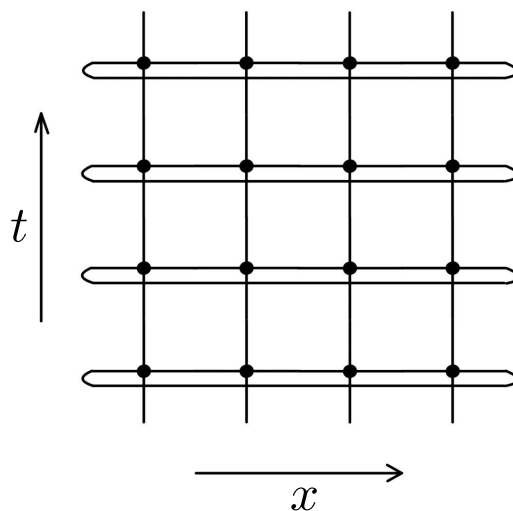
Luo-YK, arXiv:2406.08865

ξ_t is obtained from the eigenvalues of density matrix

$$\xi_t = \frac{N_t}{\ln \left(\frac{\lambda_0}{\lambda_1} \right)}$$

λ_0 and λ_1 are the largest and second largest eigenvalues

ex. density matrix on 4×4 lattice



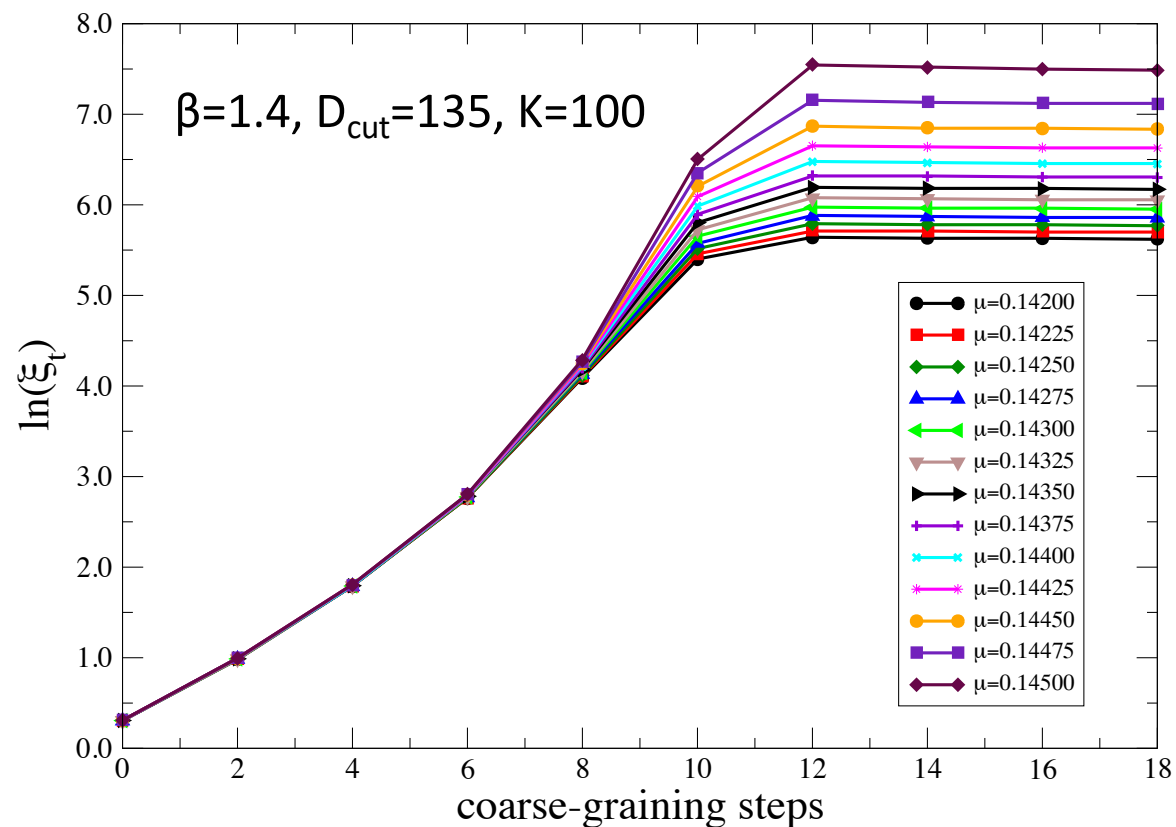
Eigenvalues are calculated on reduced single tensor obtained by HOTRG



Temporal Correlation Length (2)

Luo-YK, arXiv:2406.08865

ξ_t as a function of coarse-graining steps near μ_c

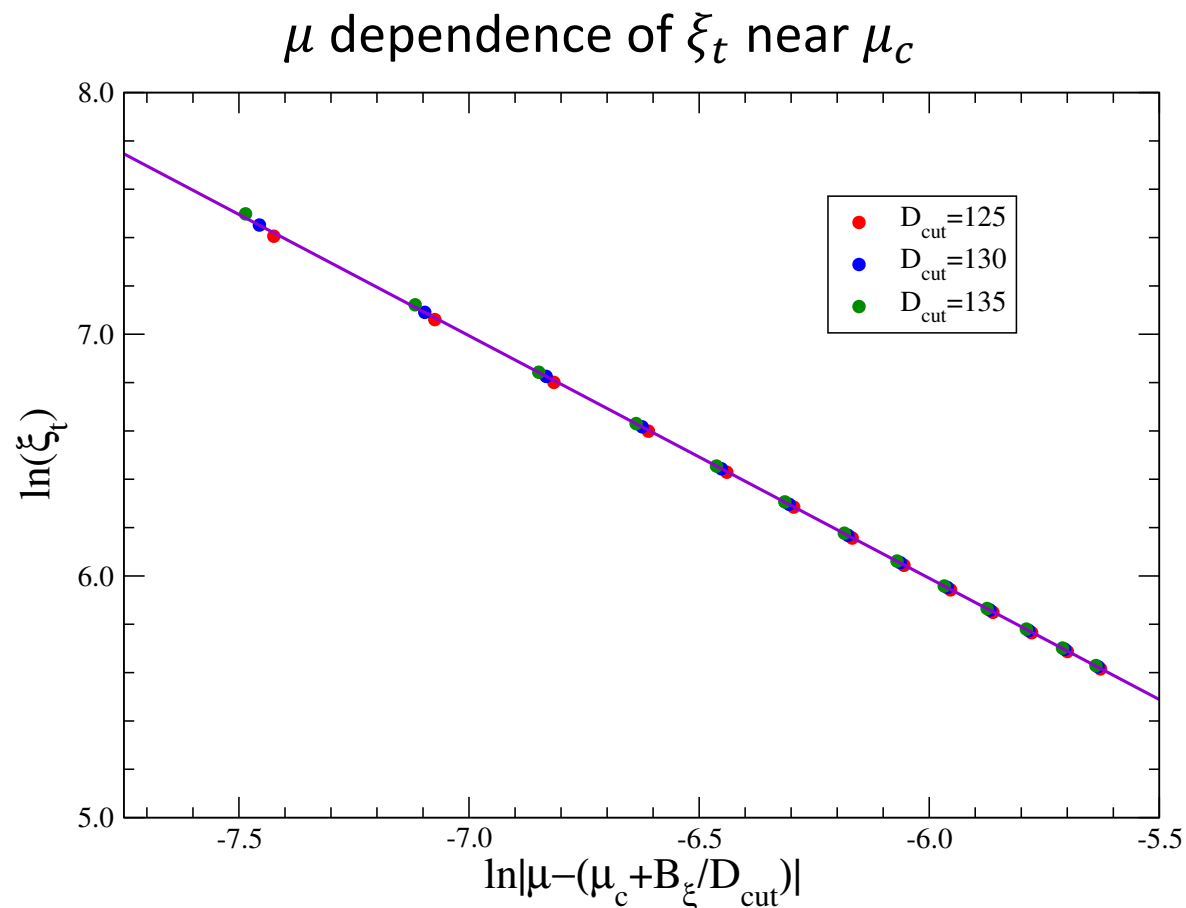


Plateau behaviors are observed for $L > \xi$ at sufficiently low temperature



Temporal Correlation Length (3)

Luo-YK, arXiv:2406.08865



Simultaneous fit with $\ln \xi_t(\mu, D_{\text{cut}}) = A_\xi + \alpha \ln |\mu - (\mu_c + B_\xi/D_{\text{cut}})|$

$$\Rightarrow \alpha = z\nu = 1.003(5), z = 1.96(6)$$

The first successful calculation of dynamical critical exponent with TRG



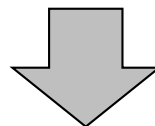
Summary and Outlook

Advantages of TRG

- Free from sign problem/complex action problem in MC method

$$Z = \int \mathcal{D}\phi \exp(-S_{\text{Re}}[\phi] + iS_{\text{Im}}[\phi])$$

- Computational cost for L^D system size $\propto D \times \log(L)$
- Direct manipulation of Grassmann numbers
- Direct evaluation of partition function Z itself



Applications in particle physics:

Finite density QCD, QFTs w/ θ -term, Lattice SUSY etc.

Also, in condensed matter physics

Hubbard model (Mott transition, High T_c superconductivity) etc.

Current status: **Calculations of 4d theories (scalar, fermion, gauge) are possible**

\Rightarrow Extension to Abelian (U(1)) and non-Abelian groups (SU(2), SU(3))

Non-perturbative study of Entanglement Entropy