Tensor network representation for numerical calculation and its application for the lattice QFT

[KN, Kei Suzuki arXiv:<u>2207.14078]</u> [KN, L. Funcke, K. Jansen et al. arXiv:<u>2107.14220]</u> [Daisuke Kadoh, KN arXiv:1912.02414]

> Katsumasa Nakayama (RIKEN) 2022/10/06@Riken

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(1): Introduction

(2): Tensor renormalization group (up to Triad TRG)

(3): Physical examples (CP(1) model with theta term)

(4): Future application (Lattice fermion/Condensed-matter)



What is the Lattice QFT?



Lattice quantum field theory

(with Monte-Carlo)



Is there Quantum correspondence?

→Tensor network representation

$$\int D\overline{\psi}D\psi \exp\left[-\sum_{x}\mathcal{L}(\overline{\psi}_{x},\psi_{x})\right] \longleftrightarrow \sum_{\sigma_{i}} \exp\left[-\beta\left(J\sum_{i}\sigma_{i}\sigma_{i+1}+h\sum_{i}\sigma_{i}\right)\right]$$

$$\{\overline{\psi},\psi\}$$
 \clubsuit $\{\sigma_i\}$

→ Need to consider path integral measure

(Another method: MPS, PEPS... as a Hamiltonian formalism)4



Physically ?

1. Generalized transfar matrix (tensor)

- 2. Spin statistial representation (e.g. Ising model)
- 3. Hopping term expansion
- Advantages and disadvantages
 Sign problem
- Another representation
- •Low cost (low dim)

Partition function

×High cost (high dim) \triangle Systematic error

→Tensor Renormalization group



(Simple) Tensor renormalization group (TRG)

[M.Levin and C. P. Nave arXiv:cond-mat/0611687]

Higher-Order TRG (HOTRG)

[Z.Y. Xie, J. Chen, et al. arXiv:1201.1144]



[Daisuke Kadoh, KN arXiv:1912.02414]



Simple TRG, Anisotropic TRG, **Bond-weighted TRG**, Core TRG. CTMRG. <u>GIRT,</u> <u>HOTRG,</u> Randomized TRG, <u>SRG,</u> TNR, Loop-TNR, Triad TRG,...

...and these combinations.



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Simple) Tensor renormalization group (TRG)

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Starting point: network representation



Naive contraction costs $\propto {\dim(a)\dim(b)}^{Volume}$

→ How can we calculate (approximate) this contractions?





♦ Larger singular values λ have much "information" of T→ (Frobenius norm)

 \rightarrow We can approximate the matrix by the cutoff of index k

$$\dim(k) = \dim(a)\dim(b) \to D$$

• SVD for a coarse graining (e.g. Image)



[http://www.na.scitec.kobe-u.ac.jp/~yamamoto/lectures/cse-introduction2009/cse-introduction090512.PPT]

SVD for a coarse graining (e.g. lsing)



• SVD for a coarse graining (e.g. Ising)

Oritical behaviour (Specific heat)
 Oritical b



75[s], by truncated SVD

• SVD for a coarse graining (e.g. Ising)

◇ Difference from exact result (Free energy)



Exponential damping of singular value

Why this truncation is so good?



→ Exponential damping helps the approximation

Exponential damping of singular value

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♦ How fast?

SVD:

$$T_{abcd} = \sum_{k} A^k_{ac} B^k_{bd}$$
 $O(D^6)$

 ontraction:
 $T^{(n+1)}_{klmn} = \sum_{a,b} A^k_{a_{xy+1}b_{xy+1}} B^l_{a_{xy}b_{x-1y+1}} C^m_{a_{xy}b_{xy+1}} D^n_{a_{xy+1}b_{x-1y+1}}$
 $O(D^6)$

$$2^{2V} \to O((\log V) \times D^6)$$

- Large D is still difficult.
 (Higher dimension, complicated system...)
- \rightarrow We need more sophisticated algorithm.

Cost for Higher-dimensional system

Can we generalize (simple) TRG for higher dimension?

→ Formally we can, but bad approximation (and Cost)



We need more faster method (for more interesting system)



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 \diamond Contraction by projection operator $\ U$



 $\rightarrow U$ is made by SVD

$$M_{x_1x_2x_1'x_2'yy'} \equiv \sum_k T_{x_1x_1'yk} T_{x_2x_2'ky'}$$

 $[M^{t}M]_{[x_{1}x_{2}][\chi_{2}\chi_{2}]} \equiv \sum_{abcd} M^{t}_{[x_{1}x_{2}][abcd]} M_{[abcd][\chi_{1}\chi_{2}]}$

SVD Cutoff: $D^2 \rightarrow D$ Cost: $O(D^6)$

$$[M^{t}M]_{[x_{1}x_{2}][\chi_{2}\chi_{2}]} = \sum_{k} U^{k}_{[x_{1}x_{2}]} \lambda^{k} U^{k}_{[\chi_{1}\chi_{2}]}$$

Contraction Cost: $O(D^7)$ 20



[Z.Y. Xie, J. Chen, et al. arXiv:1201.1144]

Critical behaviour





♦ More higher dimension? → still difficult. Cost: $O(D^{4\dim -1})$

 \diamond 4-dim Ising $O(D^{15})$ [S.Akiyama, Y.Kuramashi et al. arXiv:1906.06060]





[Daisuke Kadoh, KN arXiv:1912.02414]

Output the Triad (Rank-3) tensor as a fundamental tensor



→ We apply HOTRG-like procedure to Triad tensor rep.

 \diamond projection operator U

contraction part









\diamond Triad rep. reduces the cost.

$$O(D^{4\dim-1}) \to O(D^{\dim+3})$$





[Daisuke Kadoh, KN arXiv:1912.02414]



PEPS and TRG (low order approximation)

→Partial SVD for low order approximation could reduce the cost of PEPS.

$$O(D^{7\sim9}) \rightarrow O(D^5)$$
 (2012)
[Wei Li, et al. arXiv:1209.2387 (2012)]

Anisotropic TRG (ATRG: TRG cost reduction by low order)
 Triad TRG (HOTRG cost reduction by low order)

 $O(D^{4\dim -1}) \to O(D^{2\dim +1}), O(D^{\dim +3})$ (2019)

 \rightarrow Low order approximation could reduce the cost,

+ extension to higher dimension. [D Adachi, et al. arXiv:1906.02007 (2019)] [D Kadoh, KN. arXiv:1912.02414 (2019)]

 \rightarrow We need to know understandings in both formalisms.



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$$e^{-S_{\theta=0}} = \exp\left[-2\beta \sum_{x,\mu} \left[z_x^* z_{x+\hat{\mu}} U_{\mu} + z_x z_{x+\hat{\mu}}^* U_{\mu}^{\dagger}\right]\right]$$

 \mathcal{Z} : complex scaler field U_{μ} : link variable

 \diamond Using expansion by orthogonal function $f_{l,m}$

$$e^{-S_{\theta=0}} = \prod_{x,\mu} \frac{1}{2\beta} \sum_{l,m=0}^{\infty} I_{l+m+1}(4\beta) d_{l,m} f_{l,m}(z_x, z_{z+\hat{\mu}})$$

\rightarrow We need to truncate the index l, m.



→ Sufficiently large bond size D produces reliable results.

Character expansion of the theta term

◇ Theta term is also character expanded.

$$e^{i\frac{\theta}{2\pi}q_p} = \sum_{n_p \in \mathbb{Z}} e^{in_p q_p} \frac{2\sin(\pi n_p + \theta/2)}{\theta + 2\pi n_p}$$
$$q_p = A_{x,1} - A_{x+\hat{1}-\hat{2},2} - A_{x-\hat{2},1} + A_{x-\hat{2},2} \mod 2\pi$$
$$\bigvee$$
We need to truncate the index n_p .

 \rightarrow The order of the truncation error is $O(1/n_p)$.



→ Clear kink structure imply the first-order transition

We should estimate the systematic error.



- ♦ SVD bond size truncation: $|F(\beta, \theta)_{(112,2,2)} F(\beta, \theta)_{(80,2,2)}|$
- ♦ #Charactor expansion term: $|F(\beta, \theta)_{(144,3,2)} F(\beta, \theta)_{(80,2,2)}|$
- ♦ #topological term, $\#n_{\theta}$: $|F(\beta, \theta)_{(144,2,4)} F(\beta, \theta)_{(80,2,2)}|$

Motivation: Phase diagram of CP(1) model





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$$E_{\rm Cas}(L) \equiv E_{\rm vac}(L) - E_{\rm vac}(\infty)$$
$$E_{\rm vac}(\infty) \propto \int d^3k \sqrt{\mathbf{k}^2 + m^2}$$

Vacuum energy shift from the energy in infinite volume.



 It is originally suggested for photon field in 1948.

[H.B.G. Casimir, Proc. K. Ned. Acad. Wet. 51, 793 (1948)]

An experiment confirmed in 1996.

[S. K. Lamoreaux, PRL78 (1997), 5]



$$E_{\rm Cas}(L) \equiv E_{\rm vac}(L) - E_{\rm vac}(\infty)$$

Vacuum energy shift from the energy in infinite volume.

Regularization is needed.

$$E_{\rm vac}(\infty) \propto \int d^3k \sqrt{\mathbf{k}^2 + m^2} \qquad \longrightarrow \infty$$
$$E_{\rm vac}(L) \propto \int d^2k \sum_{n=0}^{\infty} \sqrt{k_1^2 + k_2^2 + \left(\frac{2n\pi}{L}\right)^2 + m^2} \qquad \longrightarrow \infty$$

Zeta-function, Abel-Plana formula...etc.

→ We apply the lattice regularization.

[K.N., and K. Suzuki, arXiv:2207.14078]

Oscillating Casimir effect



- \rightarrow We find an oscillation with a period $\tau_{\text{Cas}} = 6$.
- \rightarrow Dirac/Weyl points are at $\frac{\pi}{3}$.

$$\tau_{\rm Cas} = \frac{2\pi}{a_z k_{\rm WP/DP}}$$

Dispersion relation of Cd3As2 and Na3Bi





♦ Dirac points are at $\simeq \frac{\pi}{3.6}$

 \rightarrow Periods are expected as $\tau_{\rm Cas} \simeq 7.2$



Cd3As2 and Na3Bi



- We find oscillation periods, as expected.
- \rightarrow The oscillation is a general behaviour in realistic DSMs.



- Self-Introduction. Tensor network, lattice QFT with fermion formulations (including the model of the condensed-matter).
- SVD can produce locally optimal approximation, and take the truncated contractions.
- Traid TRG introduce triad (3-order) tensor to reduce the cost.
- In CP(1) model, we use sophisticated algorithm to produce reliable result.
- I also mention that the lattice condensed matter systems with Casimir energy as a future application of TRG.





