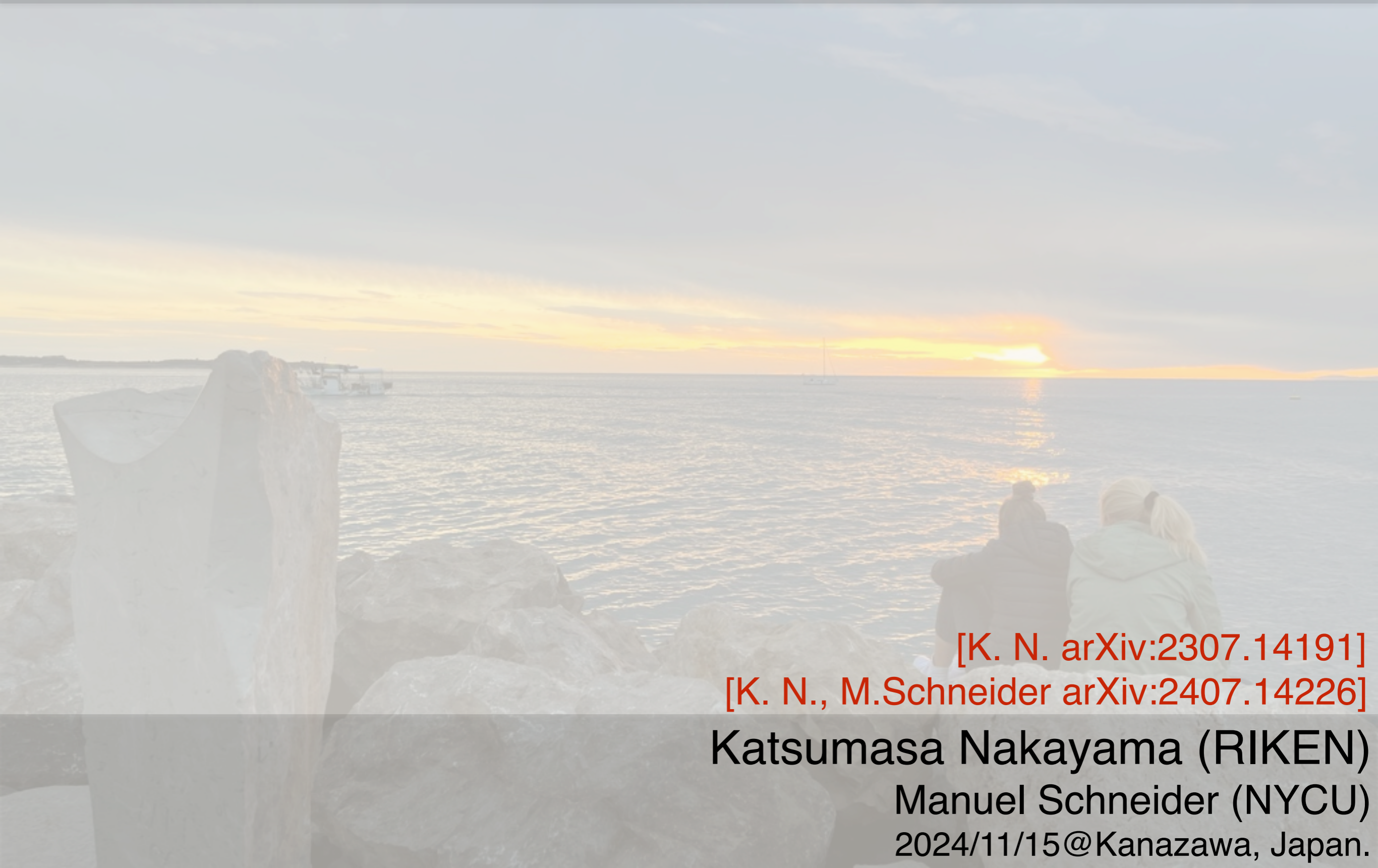


The construction and dependence of the initial tensor for the TRG with the Steiner tree problem.



[K. N. arXiv:2307.14191]

[K. N., M.Schneider arXiv:2407.14226]

Katsumasa Nakayama (RIKEN)

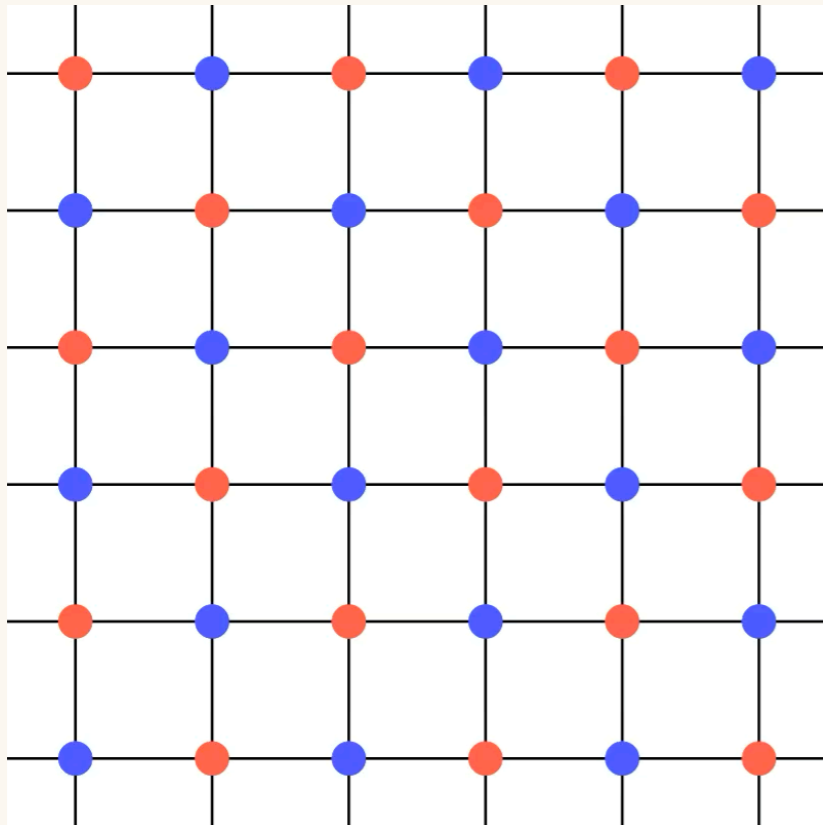
Manuel Schneider (NYCU)

2024/11/15@Kanazawa, Japan.

● Tensor renormalization group (TRG)

◇ What is the TRG?

→ TRG is approximated contraction of
(locally connected) Tensor network.



→ TRG require typical form of the tensor representation.

(Should be represented by graph)

$$Z = \text{Tr} \sum_{i \in \text{lattice}} A_{x_i y_i x'_i y'_i}$$

[https://smorita.github.io/TN_animation/]

◇ What is the Tensor network?

→ Tensors are represented by each lattice points.

→ Indices are represented by line segments.

= Each index is only contained in two tensors.

Initial tensor network construction

● Tensor network rep. of 2dim Ising

- ◇ How to find tensor network representation?

(e.g.): 2dim Ising model (Partition function) Boltzmann factor

$$Z = \sum_{\sigma} \prod_{x,y} e^{\sigma_{x,y}\sigma_{x+1,y} + \sigma_{x,y}\sigma_{x,y+1}} = \sum_{\sigma} \prod_{x,y} K_{\sigma_{x,y}\sigma_{x+1,y}\sigma_{x,y+1}}$$

→ Tensors $K_{\sigma_{x,y}\sigma_{x+1,y}\sigma_{x,y+1}}$ do not construct tensor network.
(Index $\sigma_{x,y}$ is included in three tensors)

$$K_{\sigma_{x,y}\sigma_{x+1,y}\sigma_{x,y+1}}, K_{\sigma_{x-1,y}\sigma_{x,y}\sigma_{x-1,y+1}}, K_{\sigma_{x,y-1}\sigma_{x+1,y-1}\sigma_{x,y}}$$



- ◇ Common method: (Taylor) expansion. and $\sigma^2 = 1$ or SVD and redefinition.

● Tensor network rep. by delta matrix

[K. Nakayama, M. Schneider arXiv:2407.14226]

- ◇ Key point: Expansion produces tensor network rep. using property, e.g. $\sigma^2 = 1$ or decomposition

→ Problem: More complicated Boltzmann factor produces complicated form (difficult to find the tensor network).

- ◇ Our proposal: Index shift by delta matrix.

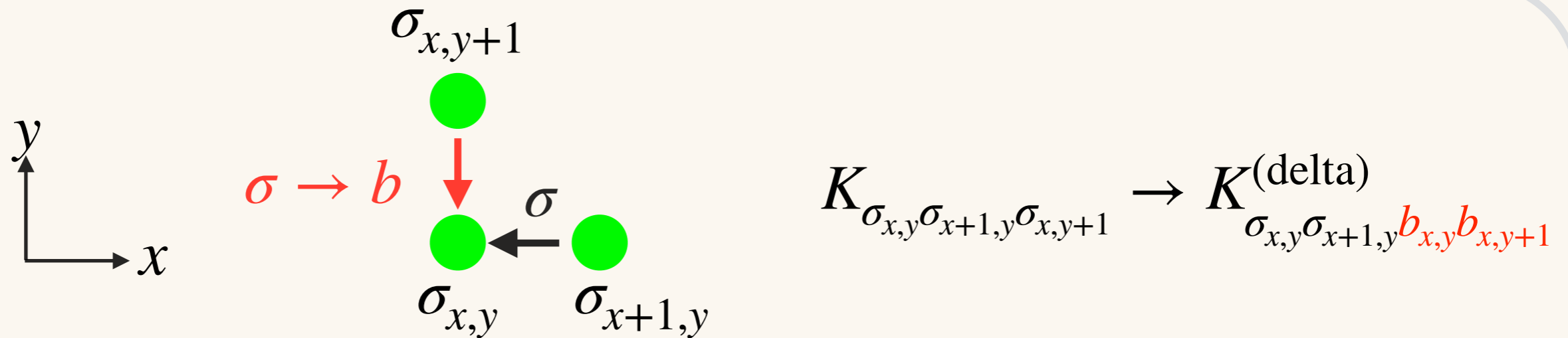
(e.g.): 2dim Ising model (periodic b.c.)

$$\begin{aligned}
 Z &= \sum_{\sigma} \prod_{x,y} K_{\sigma_{x,y}\sigma_{x+1,y}\sigma_{x,y+1}} = \sum_{\sigma,b} \prod_{x,y} K_{\sigma_{x,y}\sigma_{x+1,y}b_{x,y+1}} \delta_{b_{x,y+1}\sigma_{x,y+1}} = \sum_{\sigma,b} \prod_{x,y} K_{\sigma_{x,y}\sigma_{x+1,y}b_{x,y+1}} \delta_{b_{x,y}\sigma_{x,y}} \\
 &= \sum_{\sigma,b} \prod_{x,y} K^{(\text{delta})}_{\sigma_{x,y}\sigma_{x+1,y}b_{x,y}b_{x,y+1}}
 \end{aligned}$$

◆ index shift ($y + 1 \rightarrow y$) by δ

→ Tensor network constructed by $K^{(\text{delta})}_{\sigma_{x,y}\sigma_{x+1,y}b_{x,y}b_{x,y+1}} \equiv K_{\sigma_{x,y}\sigma_{x+1,y}b_{x,y+1}} \times \delta_{b_{x,y}\sigma_{x,y}}$

● Schematic picture of the construction



(1): Dots \leftrightarrow original indices, $\{\sigma_{x,y}, \sigma_{x+1,y}, \sigma_{x,y+1}\}$

(2): Draw arrows to connect all dots.

(3): Arrow (except σ) \leftrightarrow Index shift by δ .

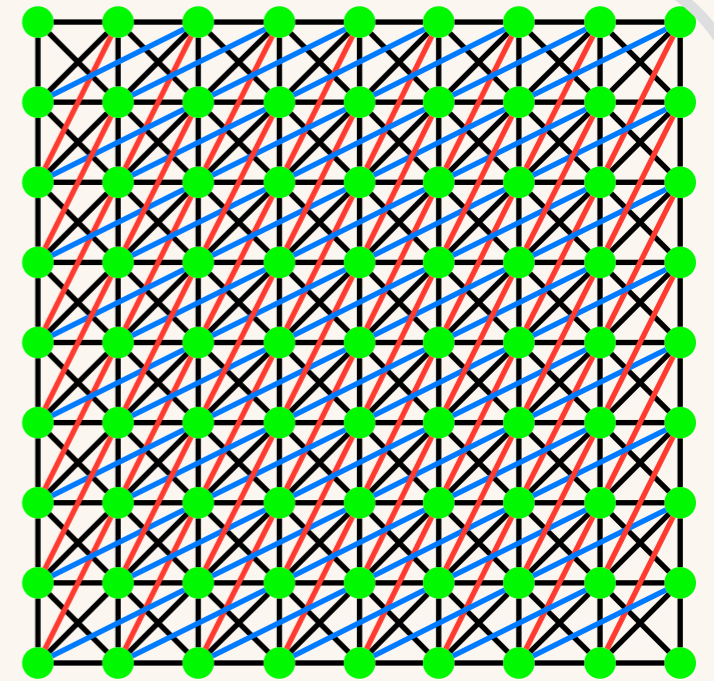
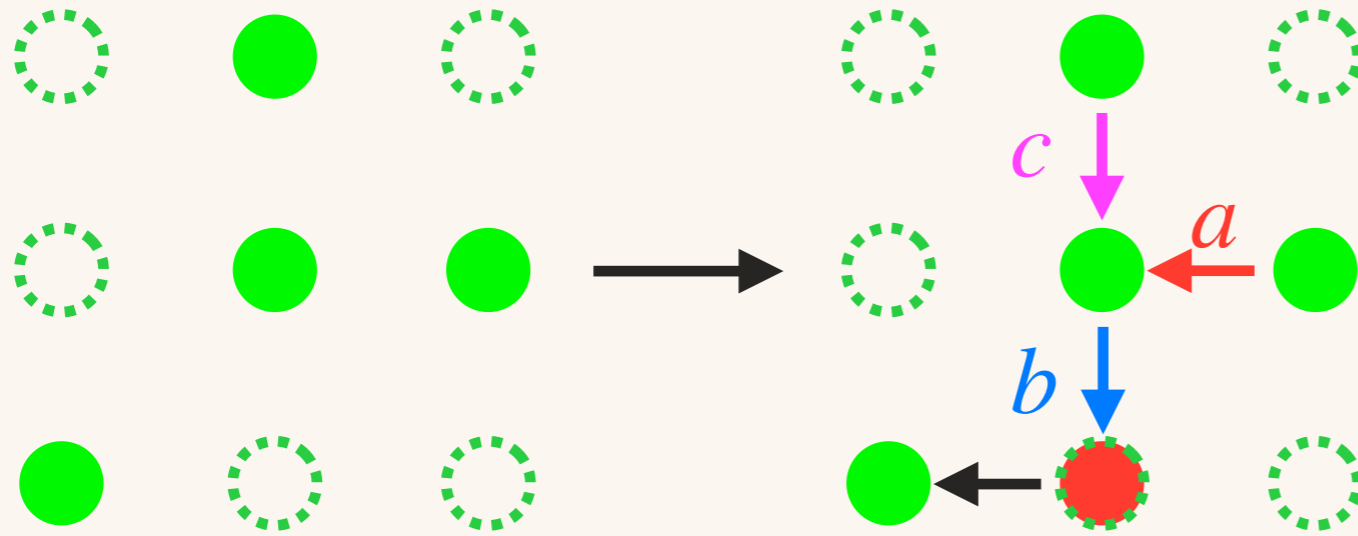


Arrows \leftrightarrow new indices, $\{\sigma, a\}$.

→ This method don't require any properties (equations).

(e.g. $\sigma^2 = 1, K_{\sigma_{x,y}\sigma_{x+1,y}\sigma_{x,y+1}} = e^{\sigma_{x,y}\sigma_{x+1,y} + \sigma_{x,y}\sigma_{x,y+1}}$)

● Generalization: J1-J2+ α



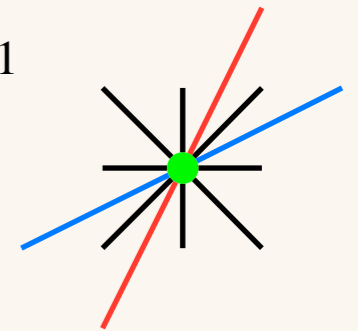
$$K_{\sigma_{x,y}\sigma_{x+1,y+1}\sigma_{x+2,y+1}\sigma_{x+1,y+2}} \rightarrow K''_{[\sigma a]_{x,y}[\sigma a]_{x+1,y}[bc]_{x,y}[bc]_{x,y+1}}$$

$$e^{h(\sigma_{x,y}+\sigma_{x+1,y+1}+\sigma_{x+2,y+1}+\sigma_{x+1,y+2})}$$

$$e^{J_1(\sigma_{x+1,y+1}\sigma_{x+2,y+1}+\sigma_{x+1,y+1}\sigma_{x+1,y+2})} e^{J_2(\sigma_{x,y}\sigma_{x+1,y+1}+\sigma_{x+2,y+1}\sigma_{x+1,y+2})} e^{g_1\sigma_{x,y}\sigma_{x+2,y+1}+g_2\sigma_{x,y}\sigma_{x+1,y+2}}$$

$$e^{t_1\sigma_{x,y}\sigma_{x+2,y+1}\sigma_{x+1,y+2}+t_2\sigma_{x,y}\sigma_{x+1,y+1}\sigma_{x+2,y+1}+t_3\sigma_{x,y}\sigma_{x+1,y+1}\sigma_{x+1,y+2}+t_4\sigma_{x+1,y+1}\sigma_{x+2,y+1}\sigma_{x+1,y+2}}$$

$$e^{e_1\sigma_{x,y}\sigma_{x+1,y+1}\sigma_{x+2,y+1}\sigma_{x+1,y+2}}$$



→ Added red dot is Steiner point.

→ In general: Rectilinear Steiner tree problem (generalization of the traveling salesman problem).

→ K'' has only $4 \times 4 \times 4 \times 4$ indices.

● J1-J2+α: Frustrated system with 12 parameters.

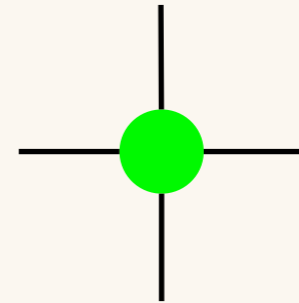
1-spin

$$e^{h(\sigma_{x,y} + \sigma_{x+1,y+1} + \sigma_{x+2,y+1} + \sigma_{x+1,y+2})}$$



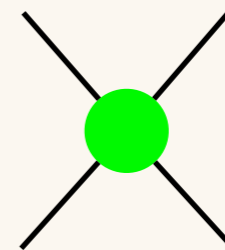
2-spin (J1)

$$e^{J_1^{(x)} \sigma_{x+1,y+1} \sigma_{x+2,y+1} + J_1^{(y)} \sigma_{x+1,y+1} \sigma_{x+1,y+2}}$$



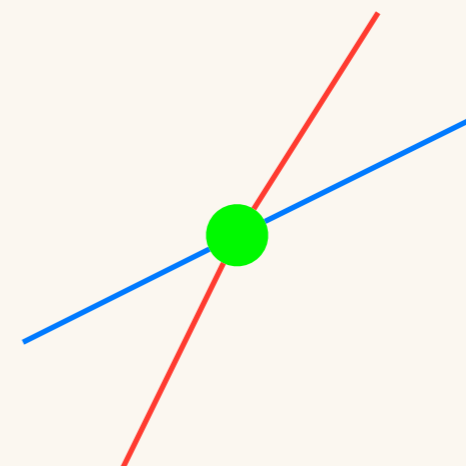
2-spin (J2)

$$e^{J_2^{(a)} \sigma_{x,y} \sigma_{x+1,y+1} + J_2^{(b)} \sigma_{x+2,y+1} \sigma_{x+1,y+2}}$$



2-spin (g1,g2)

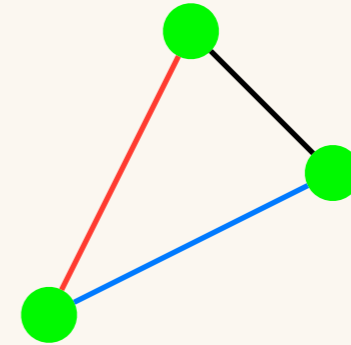
$$e^{g_1 \sigma_{x,y} \sigma_{x+2,y+1} + g_2 \sigma_{x,y} \sigma_{x+1,y+2}}$$



● J1-J2+ α : Frustrated system with 12 parameters.

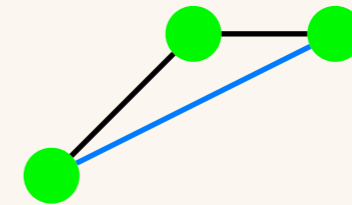
3-spin t1

$$e^{t_1 \sigma_{x,y} \sigma_{x+2,y+1} \sigma_{x+1,y+2}}$$



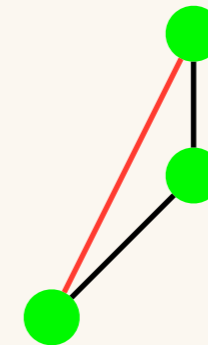
3-spin t2

$$e^{t_2 \sigma_{x,y} \sigma_{x+1,y+1} \sigma_{x+2,y+1}}$$



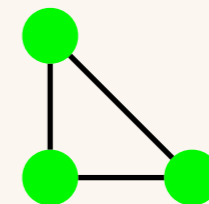
3-spin t3

$$e^{t_3 \sigma_{x,y} \sigma_{x+1,y+1} \sigma_{x+1,y+2}}$$



3-spin t4

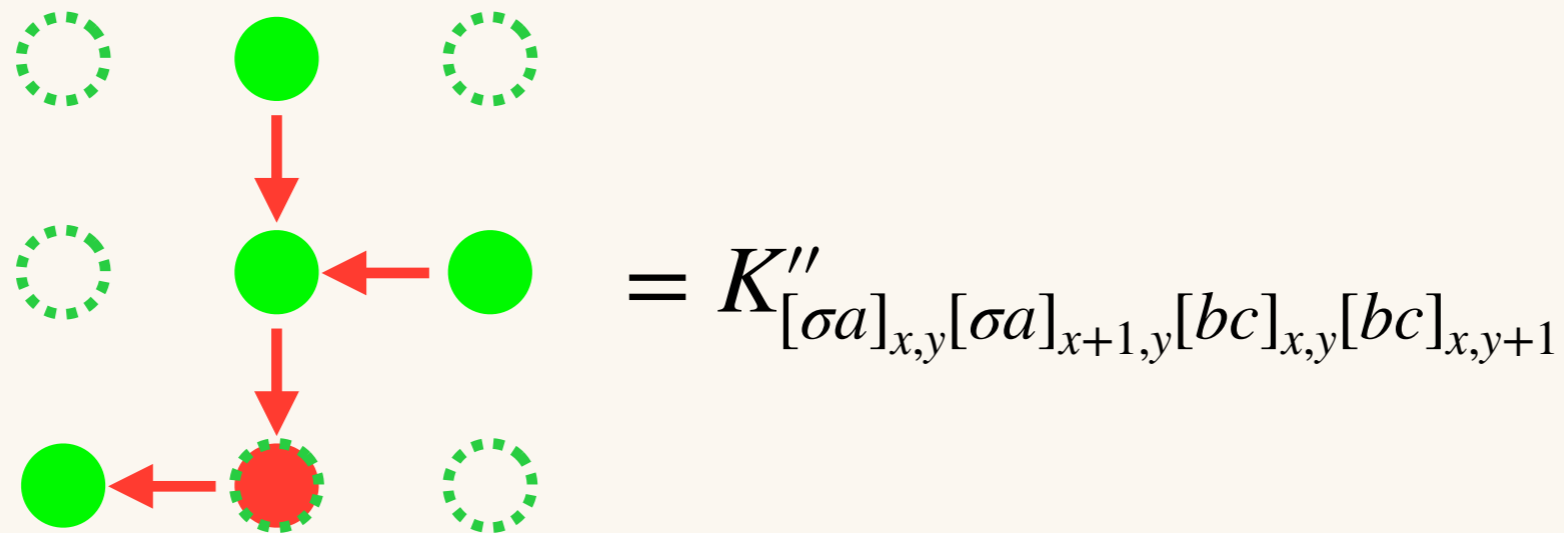
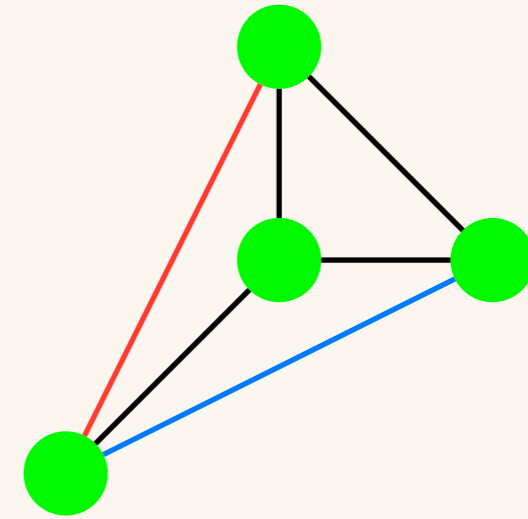
$$e^{t_4 \sigma_{x+1,y+1} \sigma_{x+2,y+1} \sigma_{x+1,y+2}}$$



● J1-J2+α: Frustrated system with 12 parameters.

4-spin

$$e^{e_1 \sigma_{x,y} \sigma_{x+1,y+1} \sigma_{x+2,y+1} \sigma_{x+1,y+2}}$$



◇ Num. of kind of interaction (parameters):

$$\left(\sum_{k=2}^4 {}_4C_k \right) + 1 = 2^4 - 4 = 12$$

→ K'' has only $4 \times 4 \times 4 \times 4$ indices.

● Note: Steiner tree problem.

◇ Steiner tree problem:

Find shortest line segments (roads) between dots (towns) to connect every dots + we can freely add dots (town)



◇ Rectilinear Steiner tree problem: (NP-complete)

Steiner tree on the lattice.

[M. Hanan, SIAM Appl. Math, 14, 2, p255, (1966)]

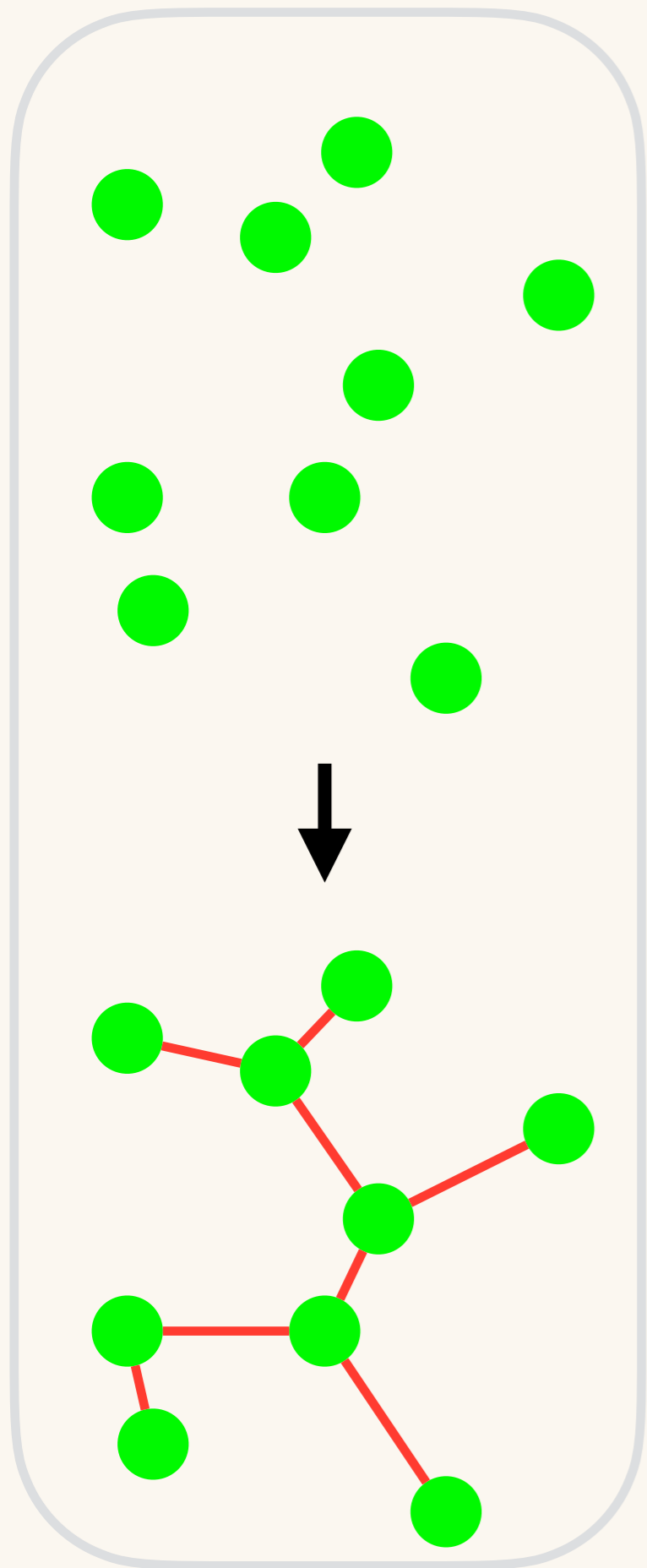
...dots on lattice points, line segments only on the links.

→ Index size of tensor = $D_{ini}^{(\text{Road length})}$

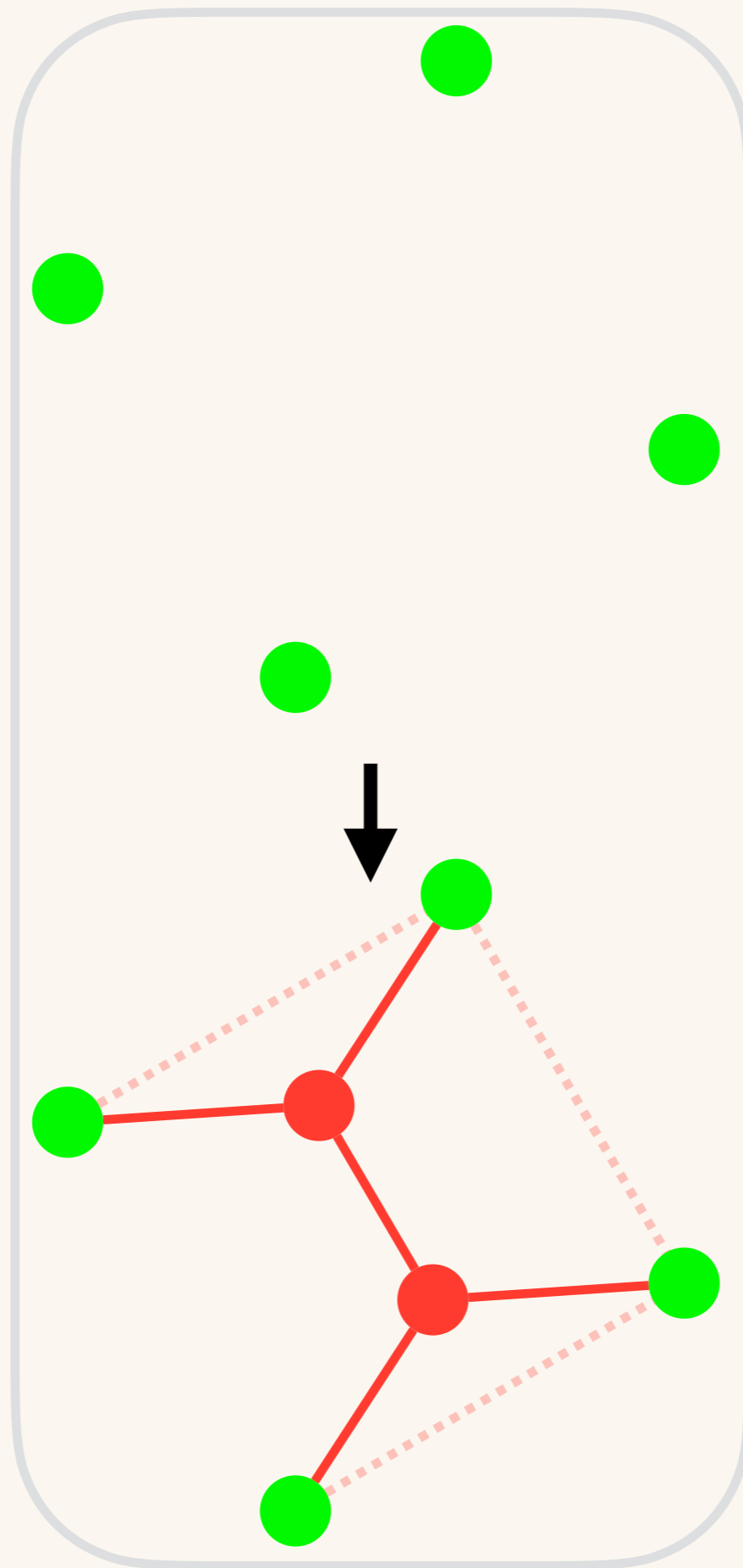
→ Long range interaction becomes harder.

→ Mild long ranges (e.g. plaquette, clover, etc.) are not hard.

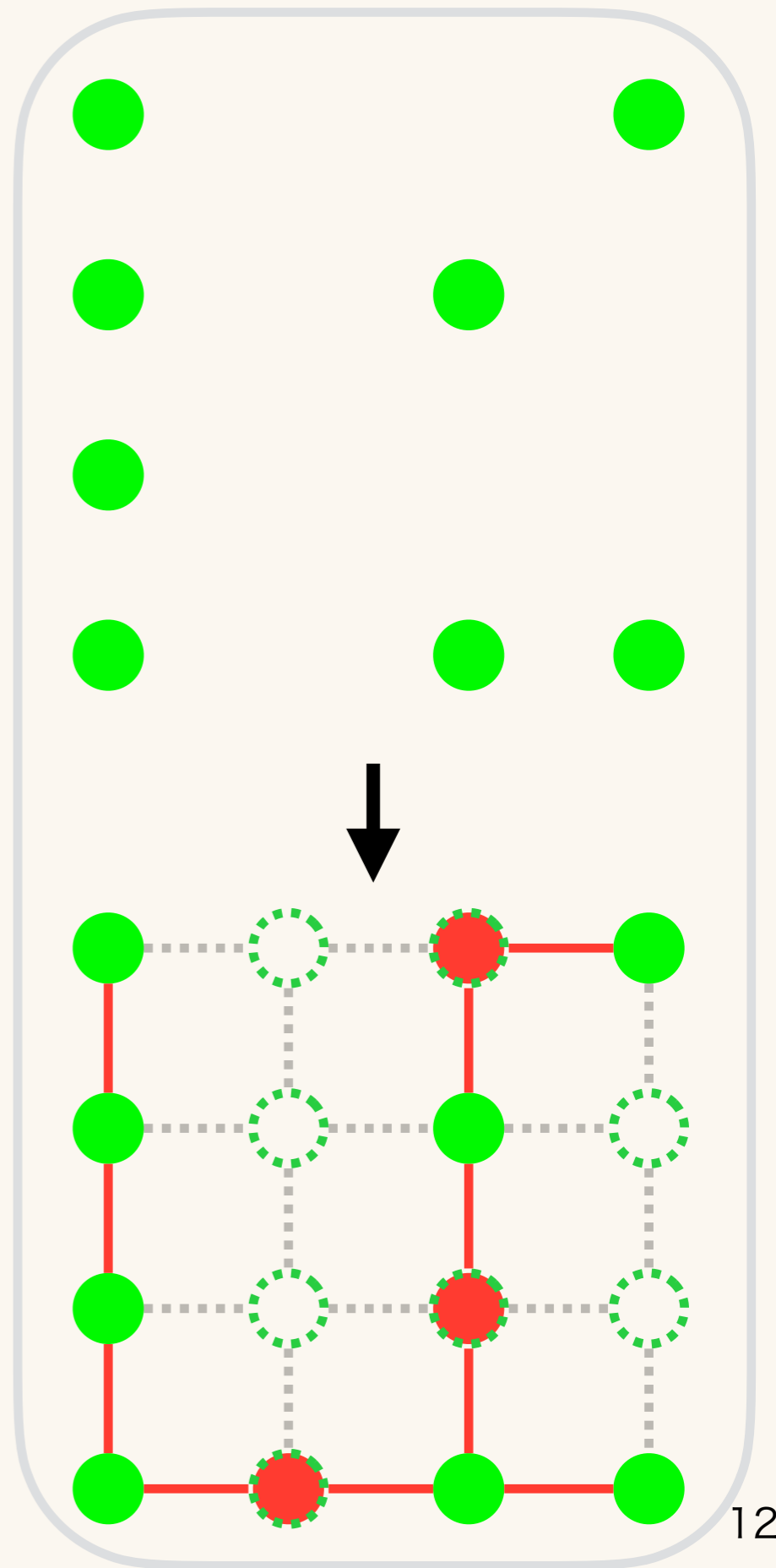
Minimum spanning



Steiner tree

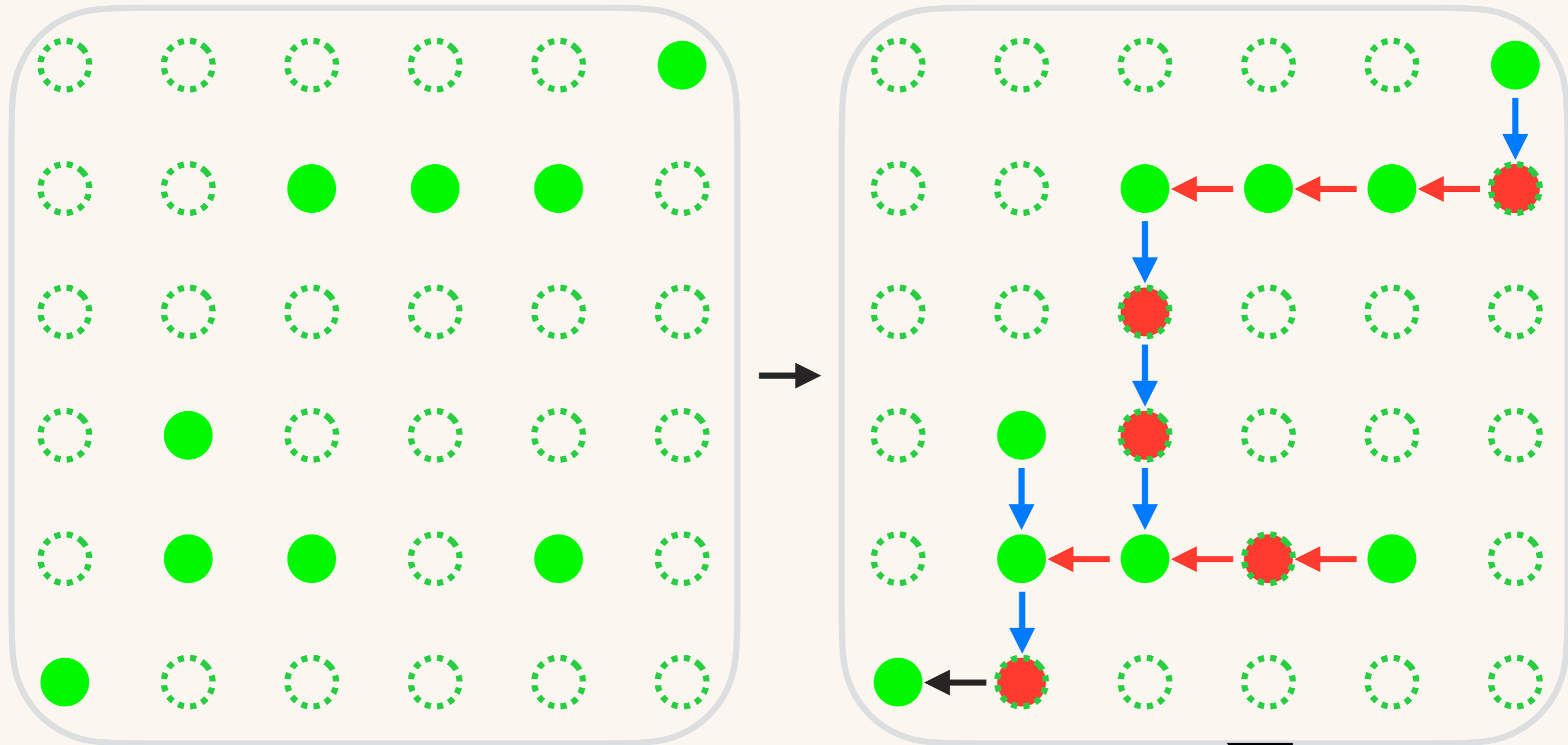


Rectilinear Steiner



● Note: (Rectilinear) Steiner tree problem

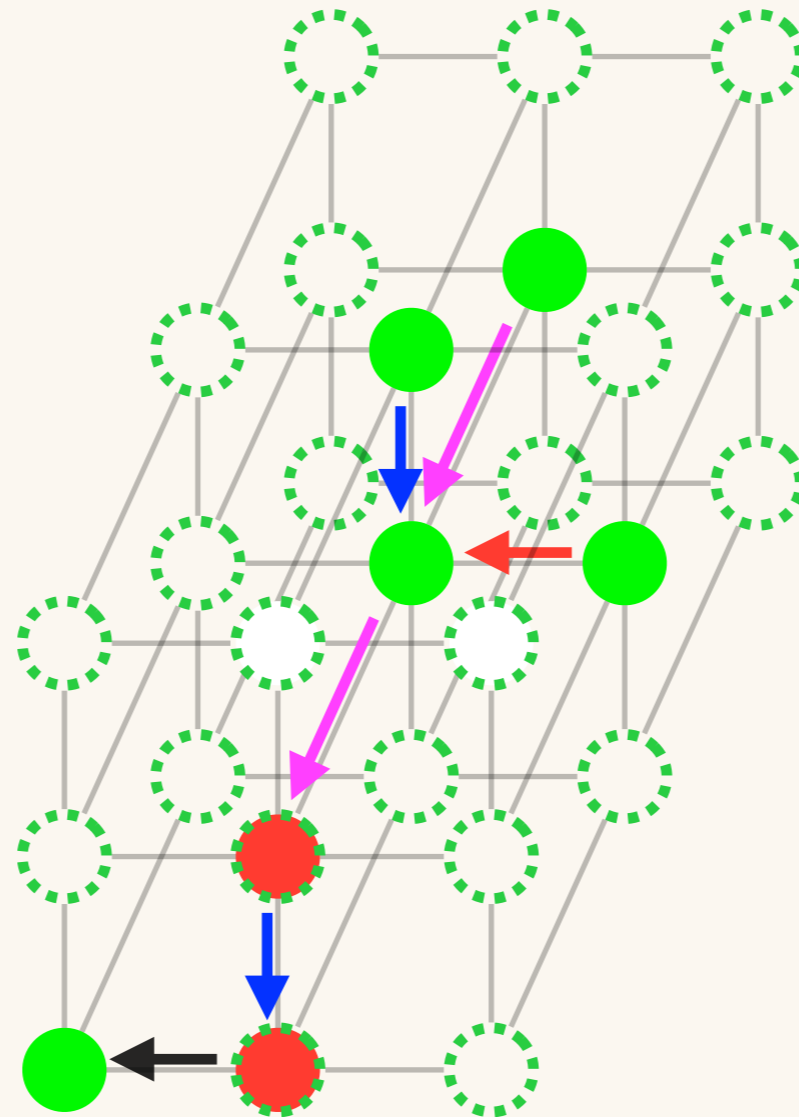
- ◇ Rectilinear Steiner tree problem: Find shortest line segment on the lattice between dots with additional dots.



→ Num. of interaction (parameters) order $\sim O(\sum 9C_k = 2^9)$

→ K'' has $2^6 \times 2^6 \times 2^7 \times 2^7$ indices.

● (e.g.) J1-J2+ α in 3dim



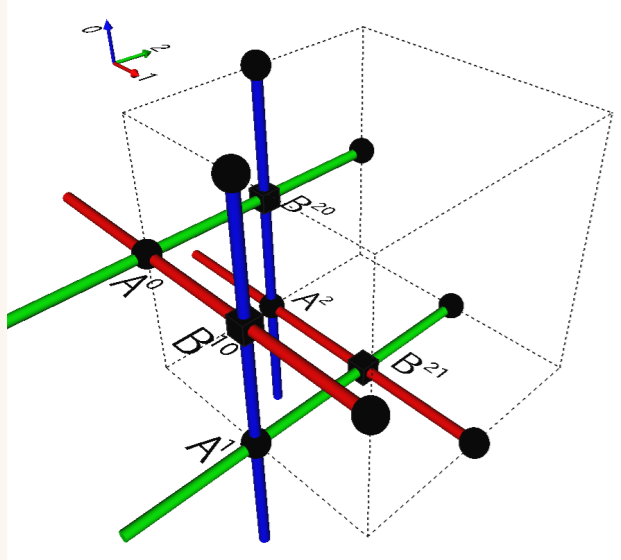
$$K^{(3d)} \sigma_{x,y,z} \sigma_{x+1,y+1,z+1} \sigma_{x+2,y+1,z+1} \sigma_{x+1,y+2,z+1} \sigma_{x+1,y+1,z+2}$$

$$\rightarrow T^{(3d)} \sigma_{x,y,z} \sigma_{x+1,y,z} a_{x,y,z} a_{x+1,y,z} b_{x,y,z} b_{x,y+1,z} c_{x,y,z} c_{x,y+1,z} d_{x,y,z} d_{x,y,z+1} e_{x,y,z} e_{x,y,z+1}$$

Tensor network rep. of 3dim Z2 gauge theory

[Y.Liu et al. arXiv:1307.6543] [Y.Kuramashi, Y.Yoshimura, arXiv:1808.08025]

- Common method: (Taylor) expansion. and $\sigma^2 = 1$



$$Z = 2^{-3V} \sum_{\sigma} \prod_{n, \mu > \nu} e^{-\beta \sigma_{n, \mu} \sigma_{n+\hat{\mu}, \nu} \sigma_{n+\hat{\nu}, \mu} \sigma_{n, \nu}}$$

$$e^{-\beta \sigma_{n, \mu} \sigma_{n+\hat{\mu}, \nu} \sigma_{n+\hat{\nu}, \mu} \sigma_{n, \nu}} = \cosh \beta \sum_{p=0}^1 (\tanh \beta)^p (\sigma_{n, \mu} \sigma_{n+\hat{\mu}, \nu} \sigma_{n+\hat{\nu}, \mu} \sigma_{n, \nu})^p$$

$$A_{pqrs} = \text{mod}(1 + p + q + r + s, 2)$$

$$B_{pqrs} = (\tanh \beta)^{(p+q+r+s)/4} \delta_{pq} \delta_{pr} \delta_{rs}$$

$$Z = \sum_{g, h, i, j, k, l} \prod_n T_{[gh]_{x,y,z} [gh]_{x+1,y,z} [ij]_{x,y,z} [ij]_{x,y+1,z} [kl]_{x,y,z} [kl]_{x,y,z+1}}^{(\text{exp})}$$

$$T_{[xX][x'X'] [yY][y'Y'] [zZ][z'Z']}^{(\text{exp})} = (\cosh \beta)^3 \sum_{a,b,c,d,e,f} A_{cyZe} A_{fzxb} A_{dYXa} B_{bx'y'c} B_{aX'Z'e} B_{fz'Y'd}$$

- In general: Any kind of expansion produces tensor network.

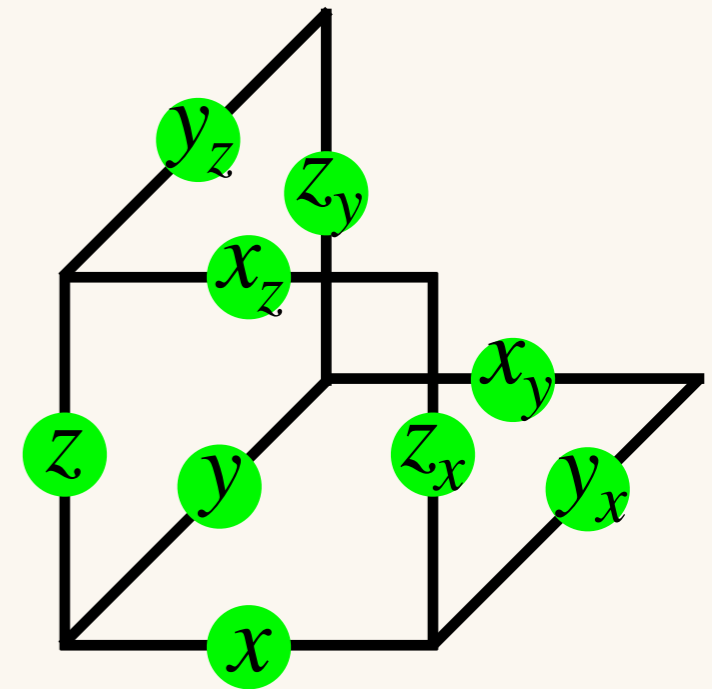
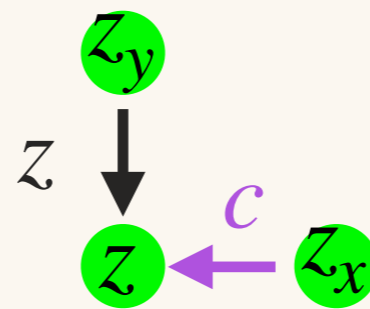
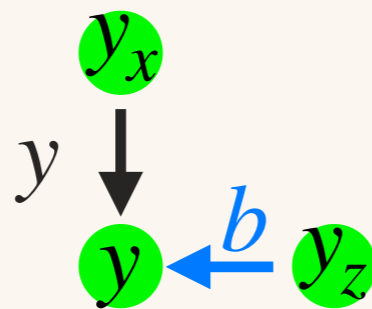
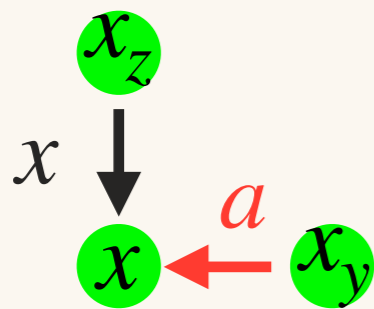
(Character for gauge theory, Orthogonal function, Taylor...) 15

Tensor network rep. of 3dim Z2 gauge theory

Our proposal: Index shift by delta matrix.

$$Z = 2^{-3V} \sum_{\sigma} \prod_{n, \mu > \nu} e^{-\beta \sigma_{n, \mu} \sigma_{n+\hat{\mu}, \nu} \sigma_{n+\hat{\nu}, \mu} \sigma_{n, \nu}} = \sum_{\sigma} \prod_{n, \mu > \nu} e^{-\beta (x x_{\hat{y}} y y_{\hat{x}} + x x_{\hat{z}} z z_{\hat{x}} + y y_{\hat{z}} z z_{\hat{y}})} / 8$$

→ x, y, z are independent with each other.

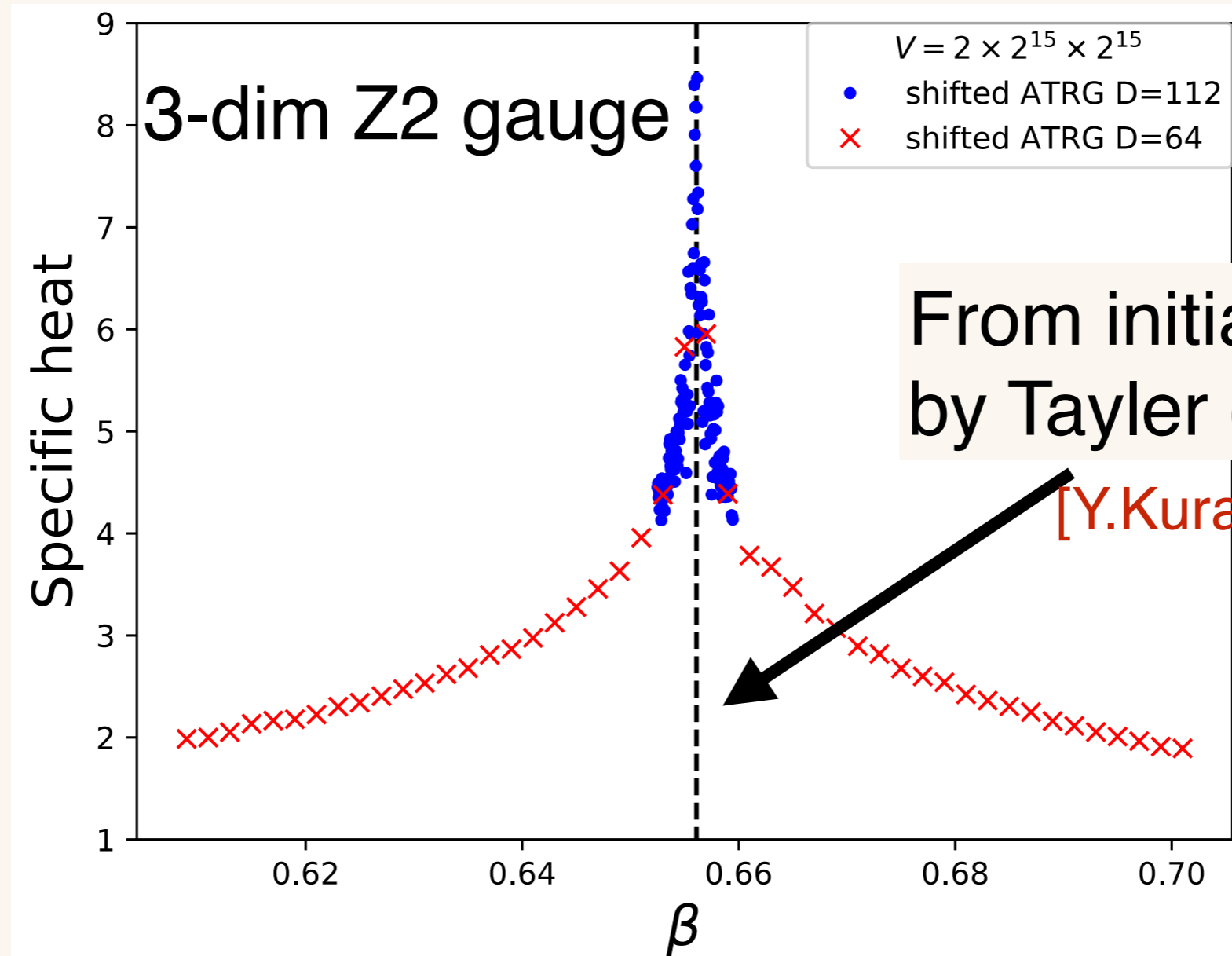


$$K_{x x_y x_z y y_z y_x z z_x z_y} \rightarrow K''_{[x b] [x b]_z [y c] [y c]_x [z a] [z a]_y}$$

→ K'' has only $4 \times 4 \times 4 \times 4 \times 4 \times 4$ indices.

● Critical temperature of 3dim Z2 gauge theory

- ◇ Numerical calc. by ATRG + impurity method



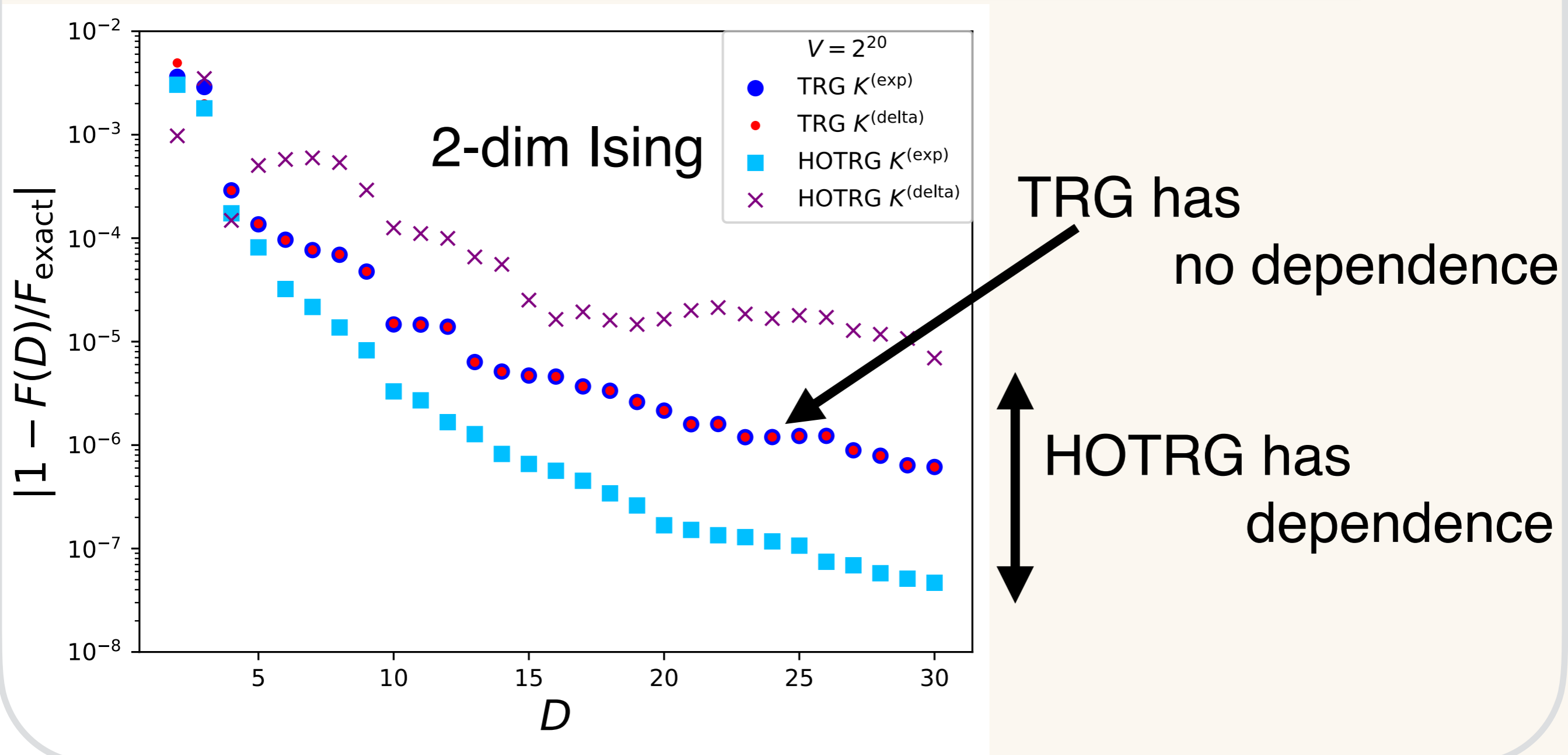
→ Our method produces correct result for critical temperature.

Initial tensor network dependence

● Initial tensor dependence

◇ Now we can construct initial tensor by simple method.

→ We did not say our method produces best precision.



→ But we can eliminate this initial tensor dependence.

● Boundary TRG

[S. Iino et al. arXiv:1905.02351]

[K. N., M. Schneider arXiv:2407.14226]

- ◇ Original HOTRG: choose U or V by minimizing the norm.

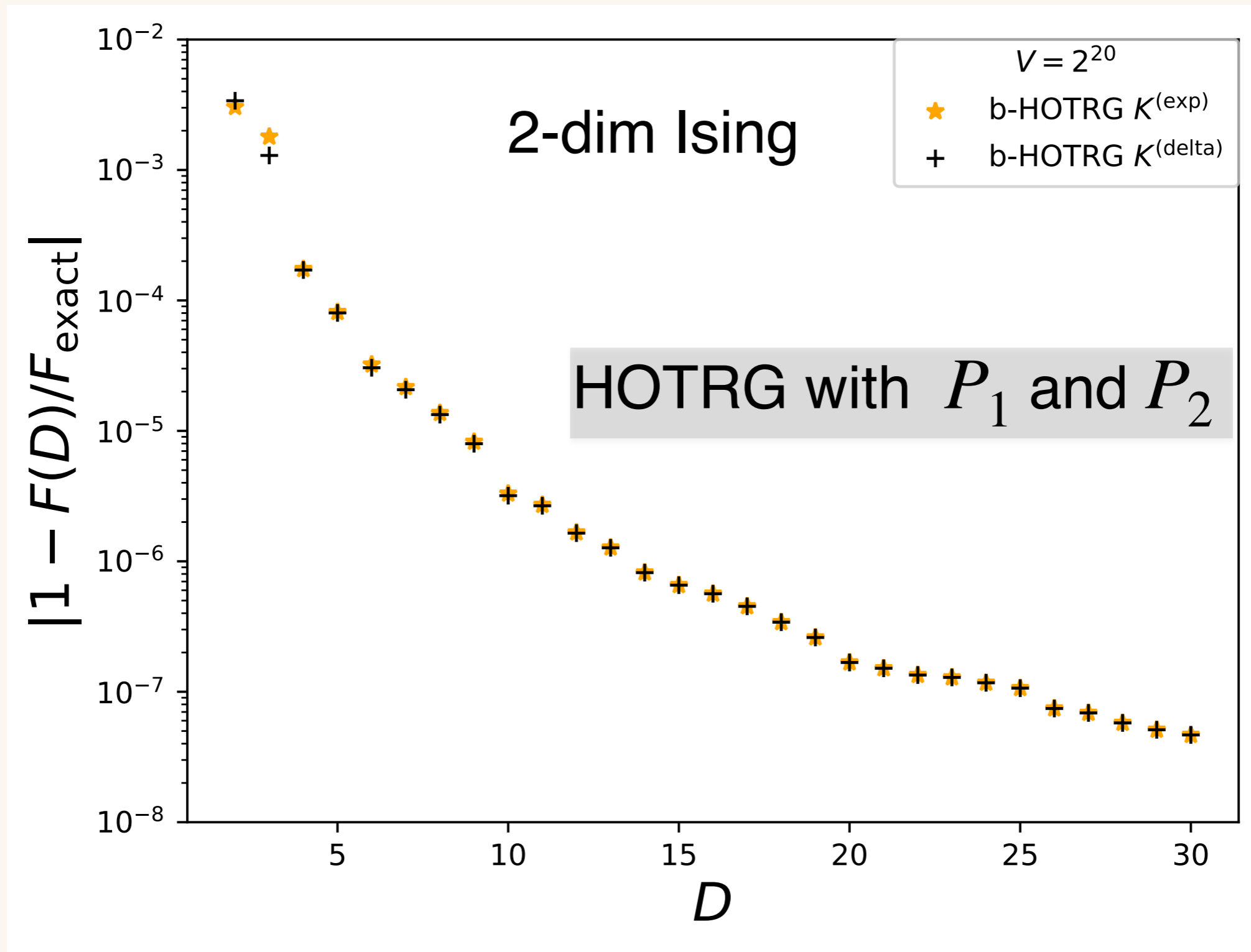
$$C_U = \left\| \begin{array}{c} K \\ \bullet \\ K \\ \bullet \end{array} - \begin{array}{c} U^\dagger(\text{HOTRG}) \\ \bullet \\ U(\text{HOTRG}) \end{array} \right\|^2 \quad C_V = \left\| \begin{array}{c} K \\ \bullet \\ K \\ \bullet \end{array} - \begin{array}{c} V(\text{HOTRG}) \\ \bullet \\ V^\dagger(\text{HOTRG}) \end{array} \right\|^2$$

- ◇ HOTRG with boundary TRG: construct P_1, P_2 by U and V .

$$C_{P_1, P_2} = \left\| \begin{array}{cc} K & \\ \bullet & \bullet \\ K & \\ \bullet & \bullet \end{array} - \begin{array}{c} P_1^{(\text{bHOTRG})} \\ \bullet \\ P_2^{(\text{bHOTRG})} \end{array} \right\|^2$$

→ Generalization from U or V to P_1 and P_2 can be done for any other TRG methods.²⁰

● Boundary HOTRG



→ HOTRG with P_1 and P_2 is initial tensor independent.

Boundary TRG for ATRG and MDTRG

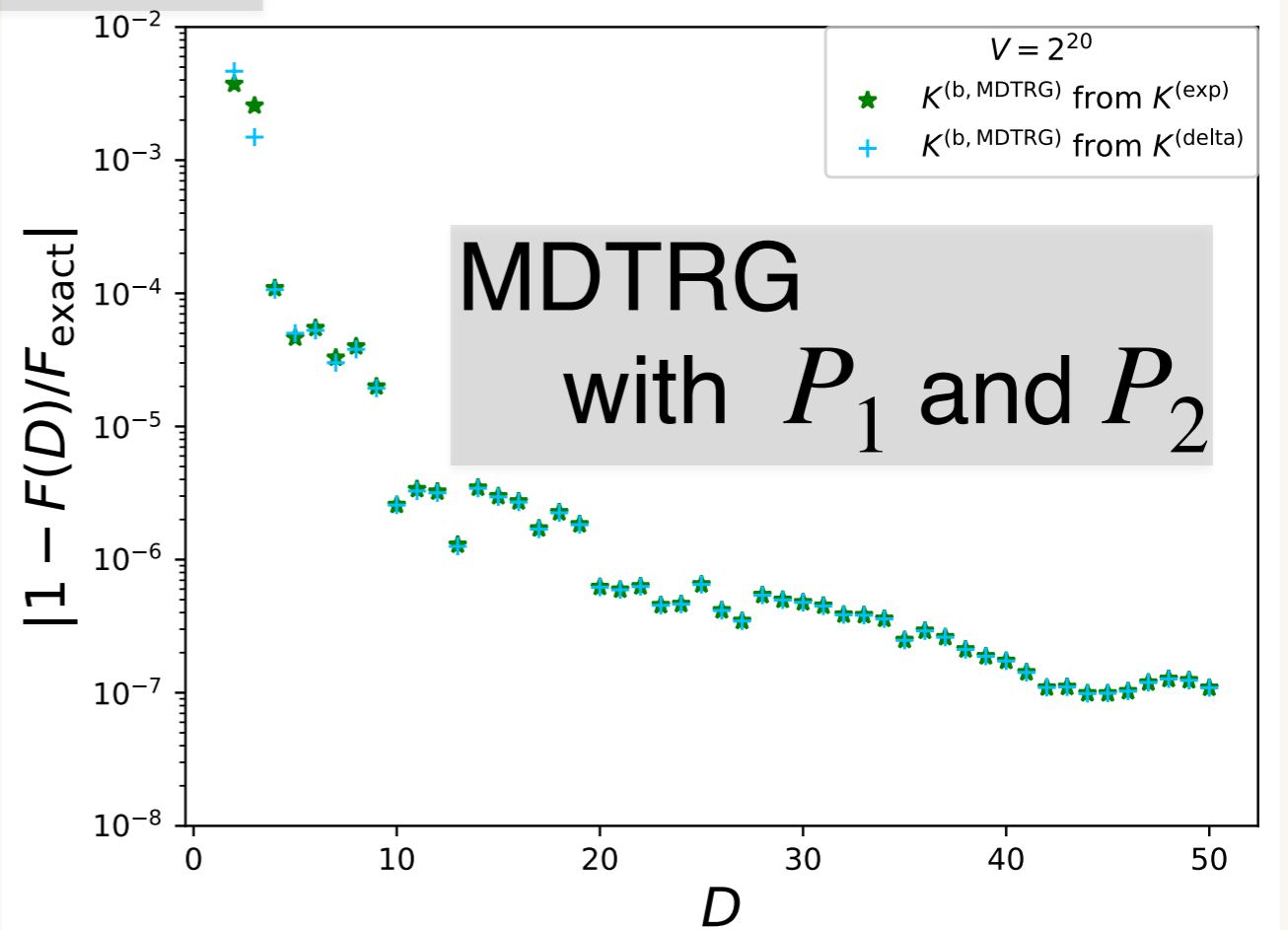
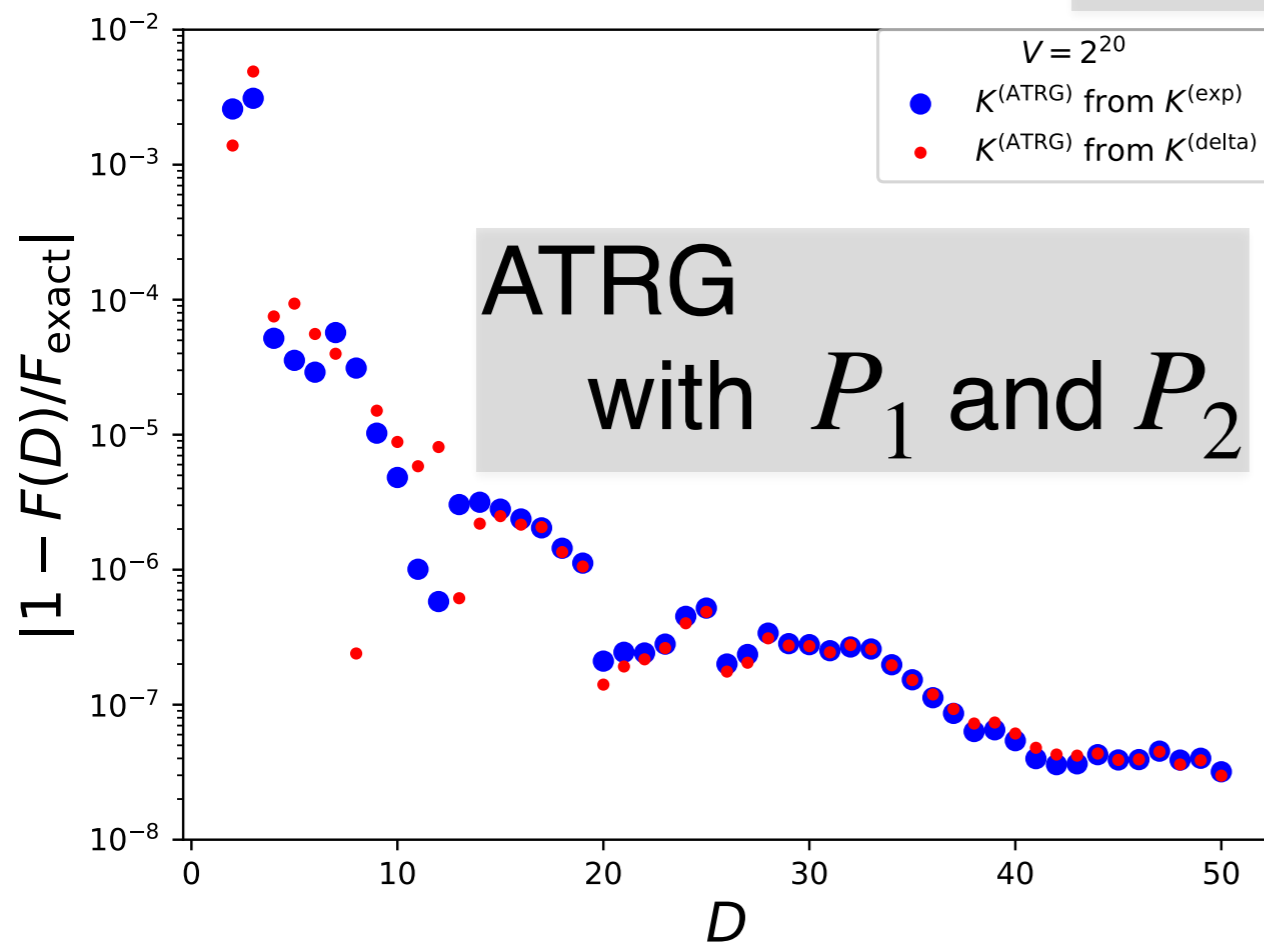
[D. Adachi et al. arXiv:1906.02007]

[D. Kadoh, K.N. arXiv:1912.02414][K.N. arXiv:2307.14191]

- ◇ Many method (ATRG, TriadTRG, MDTRG) can use isometry (U or V) or P_1 and P_2 .

[K. N., M.Schneider arXiv:2407.14226]

2-dim Ising



→ TRG methods with P_1 and P_2 are initial tensor independent.

→ Our construction can also produce compatible result.

● Summary

[main]

- ◇ We propose a general method to construct the initial tensor network from Boltzmann factor representation.
- ◇ We can eliminate initial tensor dependence by using boundary TRG method for isometry.

[details]

- ◇ This relates to the rectilinear Steiner tree problem (relates optimization prob. such as traveling salesman)
- ◇ We test our construction in the 2-dim Ising model and 3-dim Z_2 gauge theory, and reproduce results.

→ Our method could be a simple, good choice for first study. 23