

Tensor Network and Renormalization

Masahito Yamazaki



September 4, 2024 @ Tropea

Currently at Kavli IPMU, University of Tokyo



hep-th (many) hep-ph (10) hep-lat (3)

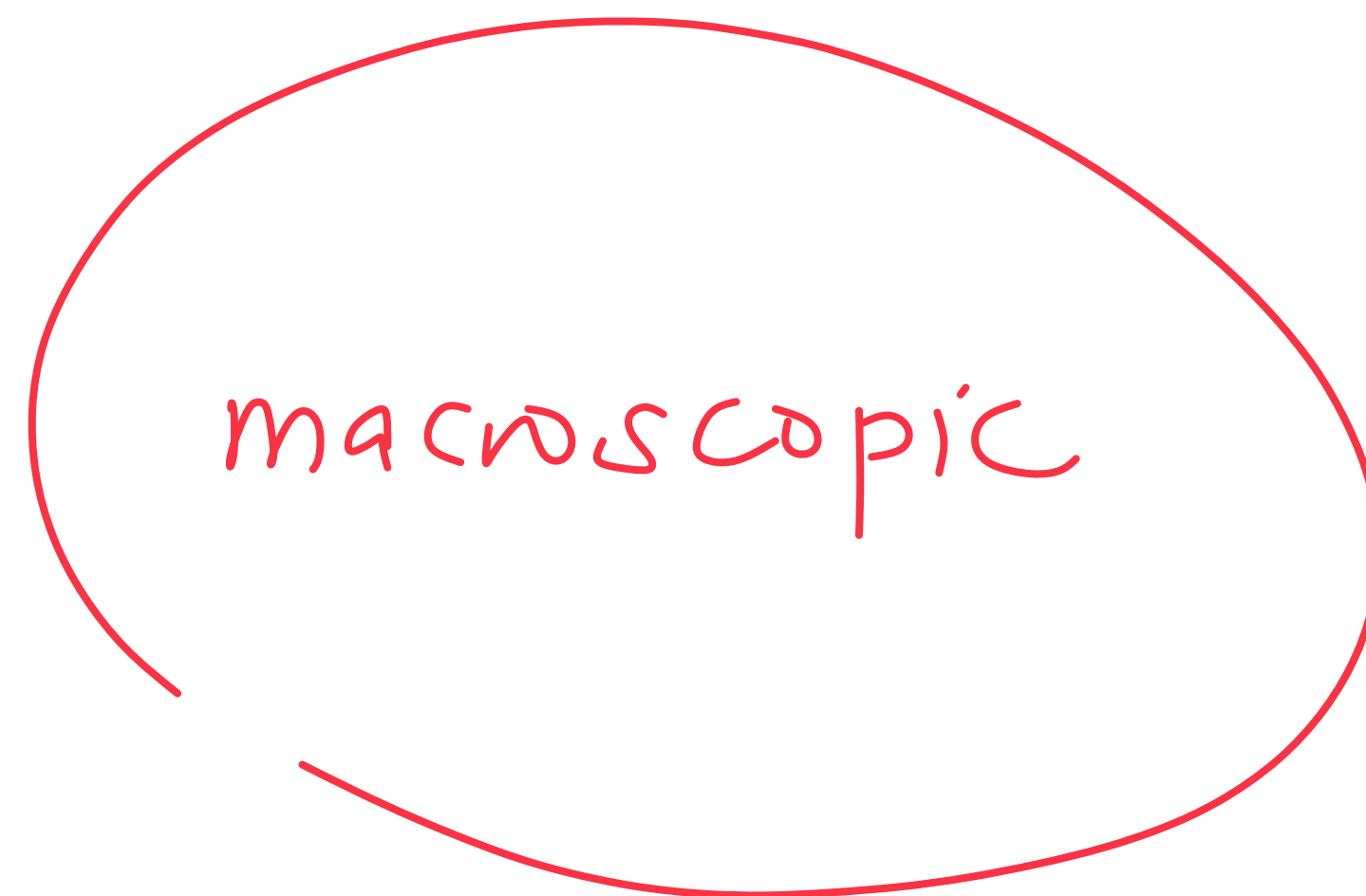
Cond-mat (3) quant-ph (1) astro-ph (1)

math-ph (2) math (8) nlin.SI (1)

Renormalization

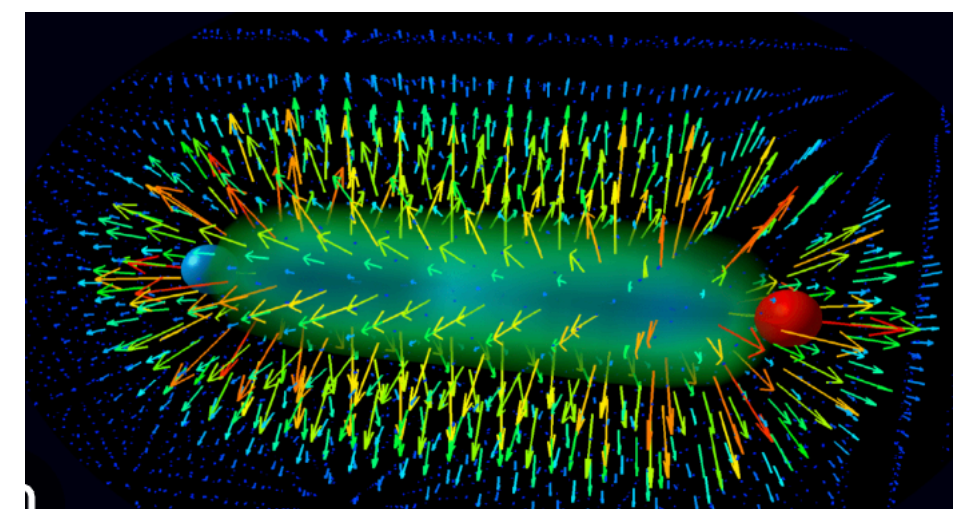
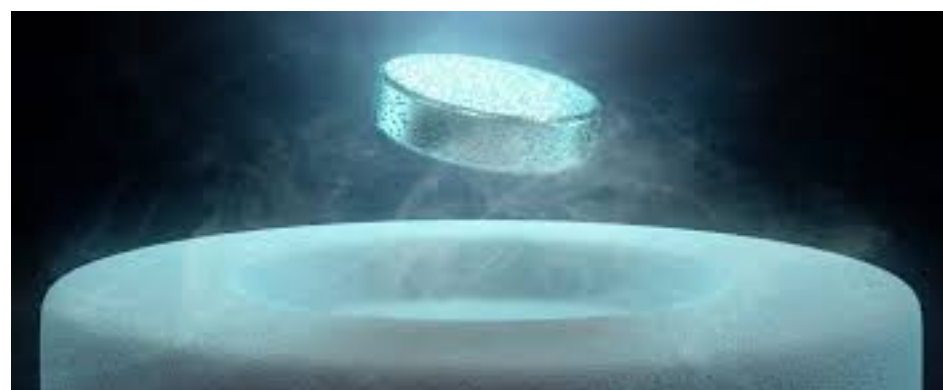
UV

IR

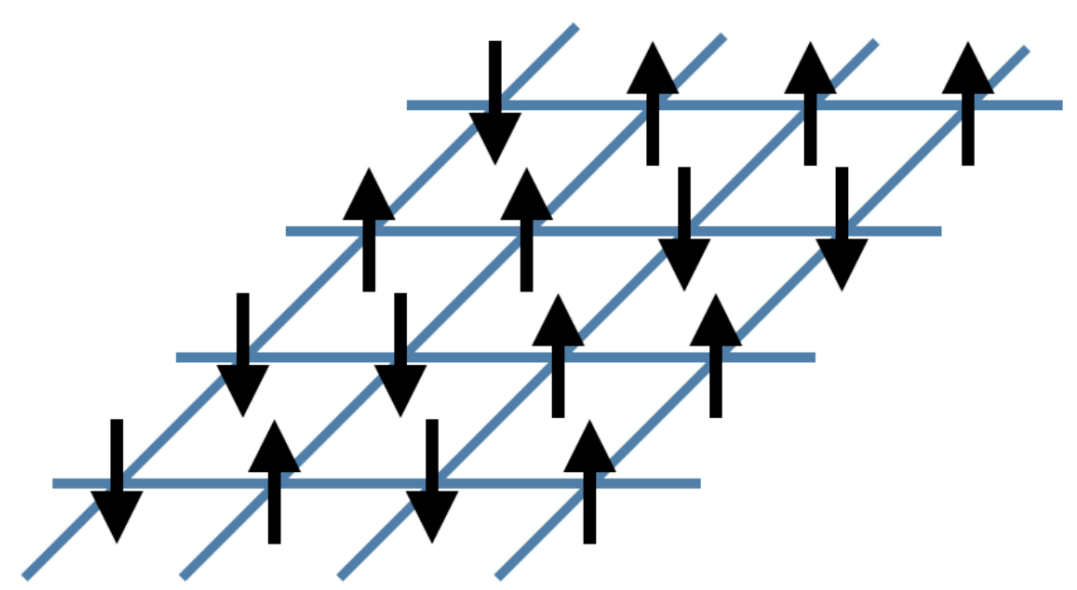
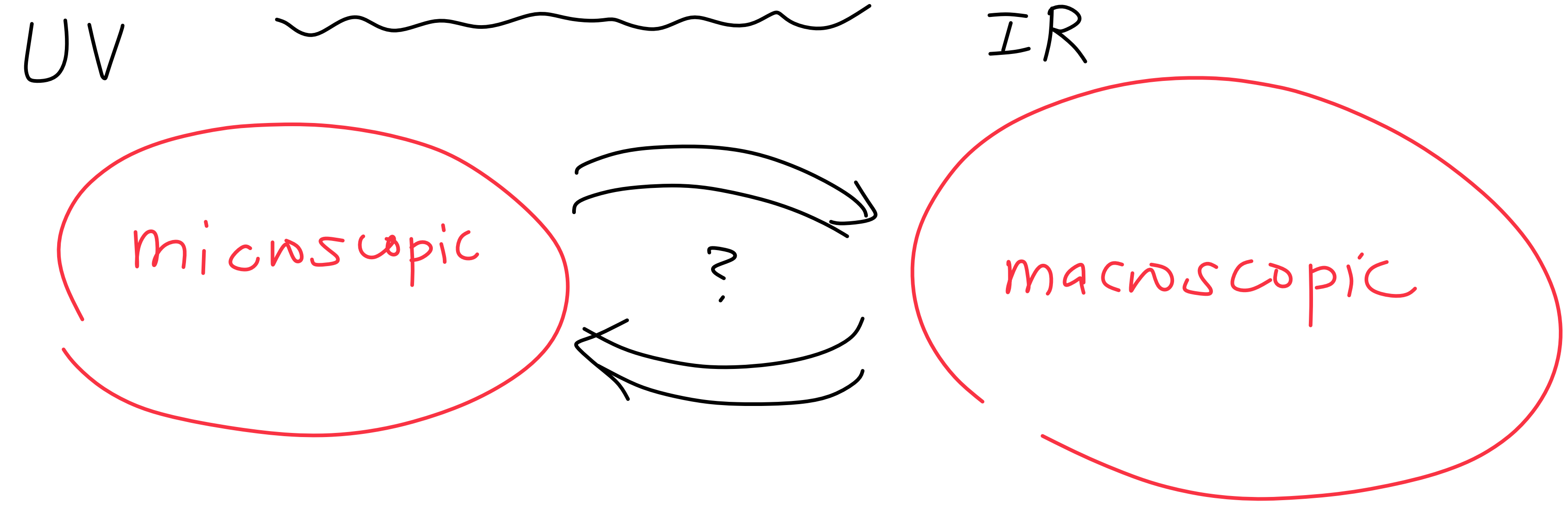


\mathcal{L} / H

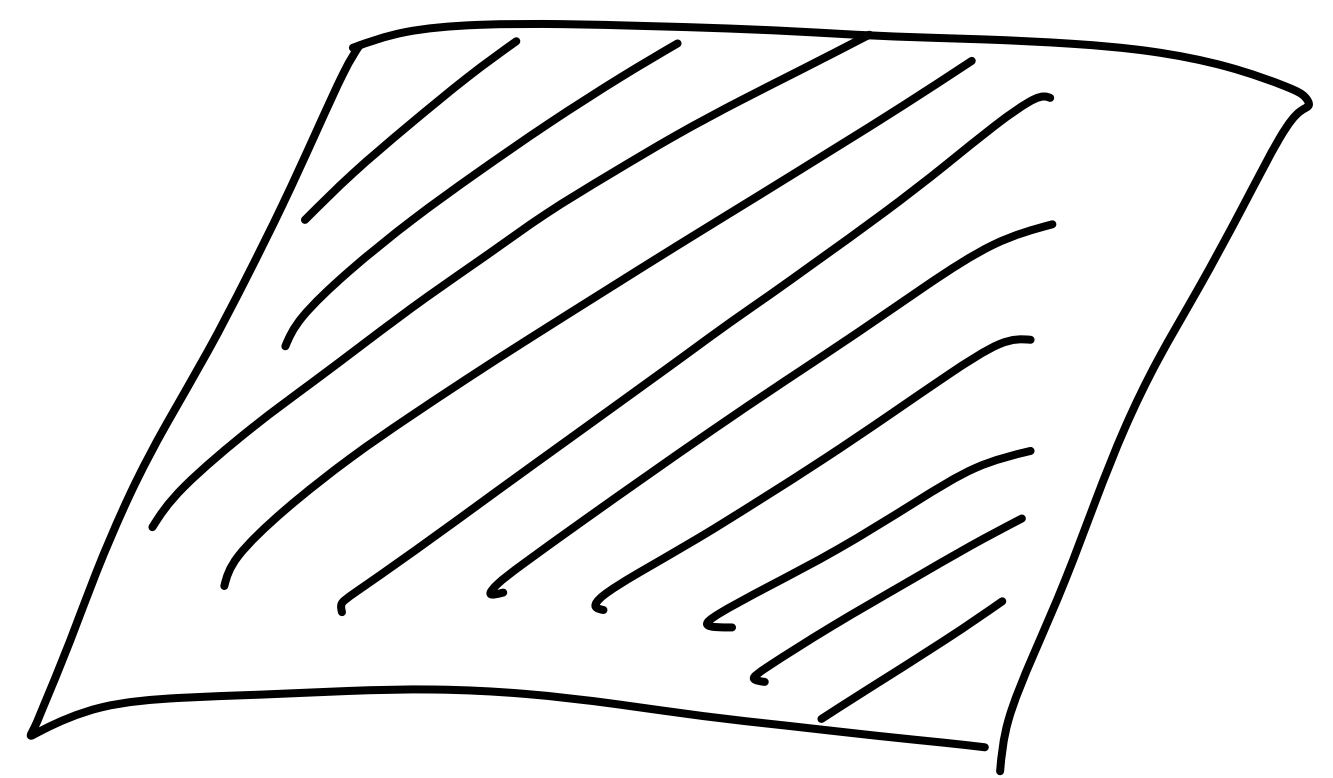
"emergent" phenomena



Renormalization



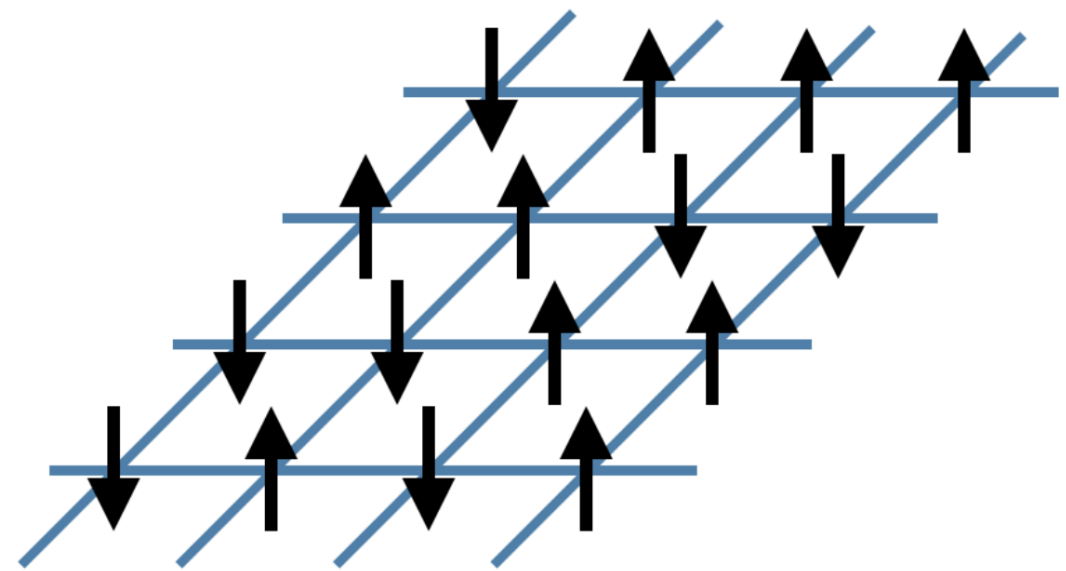
Lattice



QFT / CFT

Renormalization

- often checks with symmetries / critical exponents + universality
- can we discuss the RG flow more directly?

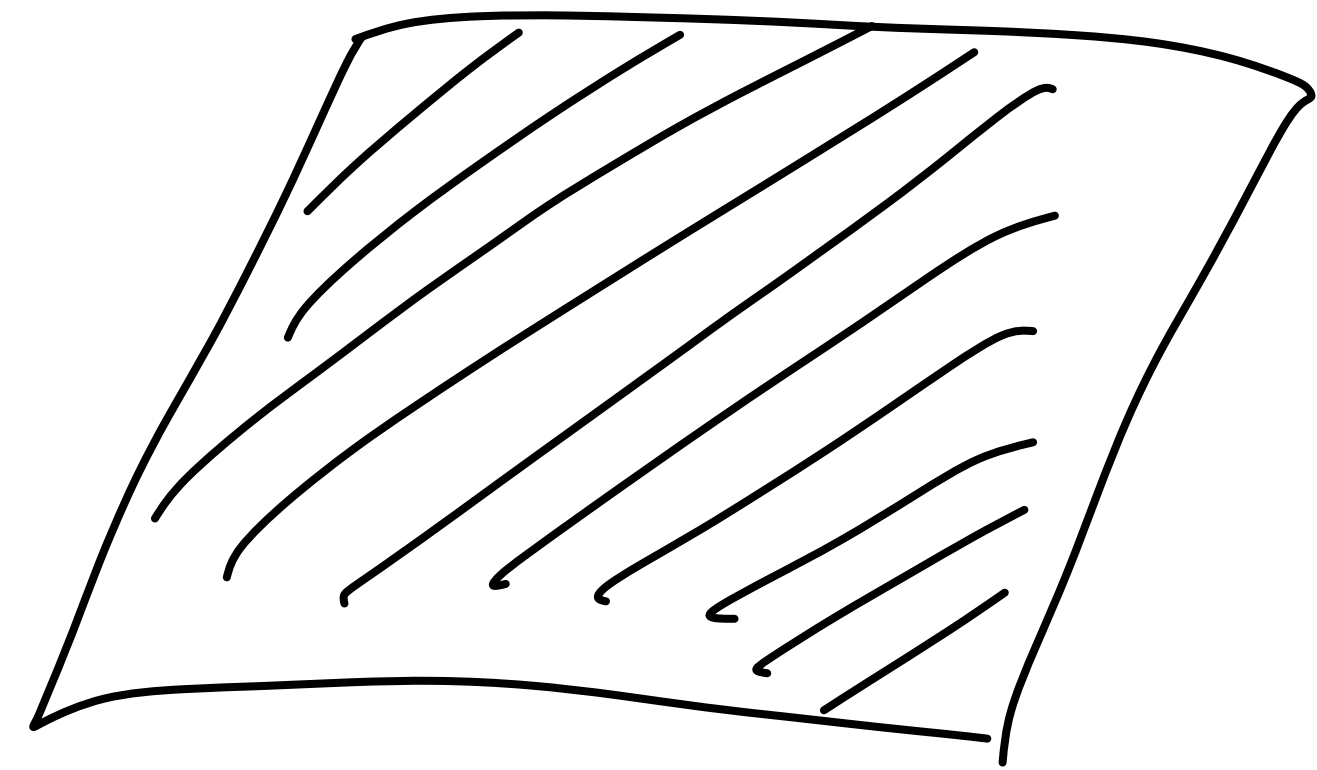


Lattice

thermodynamic/
scaling
limit



discretization



QFT / CFT

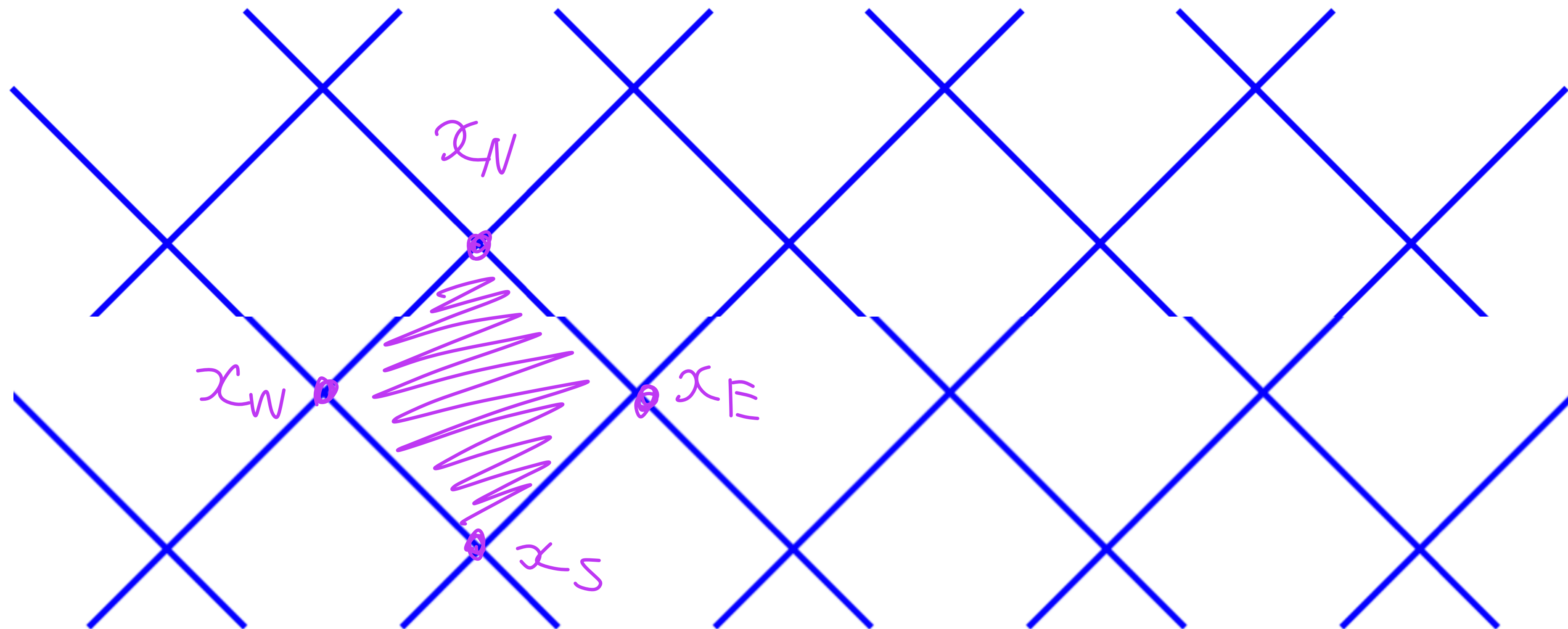
"Digression" on Integrable Models

Discretization / Regularization of QFT:

One of early-day motivations of *integrable models*

[Many papers by Destri-de Vega
also Faddeev, Reshetikhin, Volkov, ...]

time



$$x_N = f(x_W, x_E, x_S)$$

This is revisited in the context of

quantum simulation of integrable models

[Vovsiat - Zadnik - Prosen ('17)]

⇒ Integrable conserved charges on

IBM / Ion Q quantum computers

[Moruyoshi - Okuda - Pedersen - Suzuki - MY - Yoshida (22)]

- Original discussion of light-cone discretization;

Case-by-case analysis

- More systematic analysis in 4d Chern-Simons theory

[Ashwinkumar - Sakamoto - MY (23)]

↙
Sakamoto's talk
on Friday

Beyond Integrability?

Keep track RG flows?

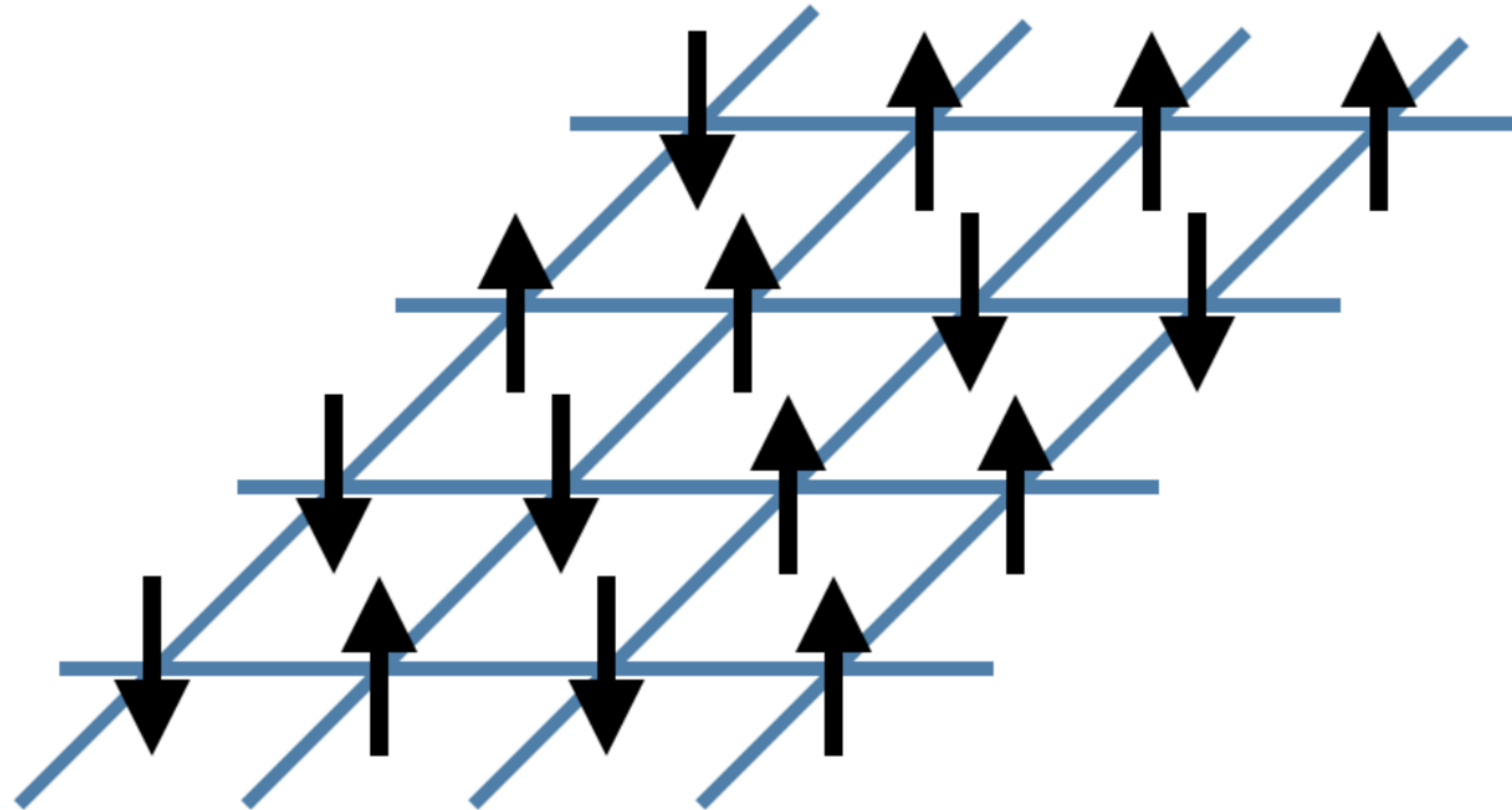
IR CFT?



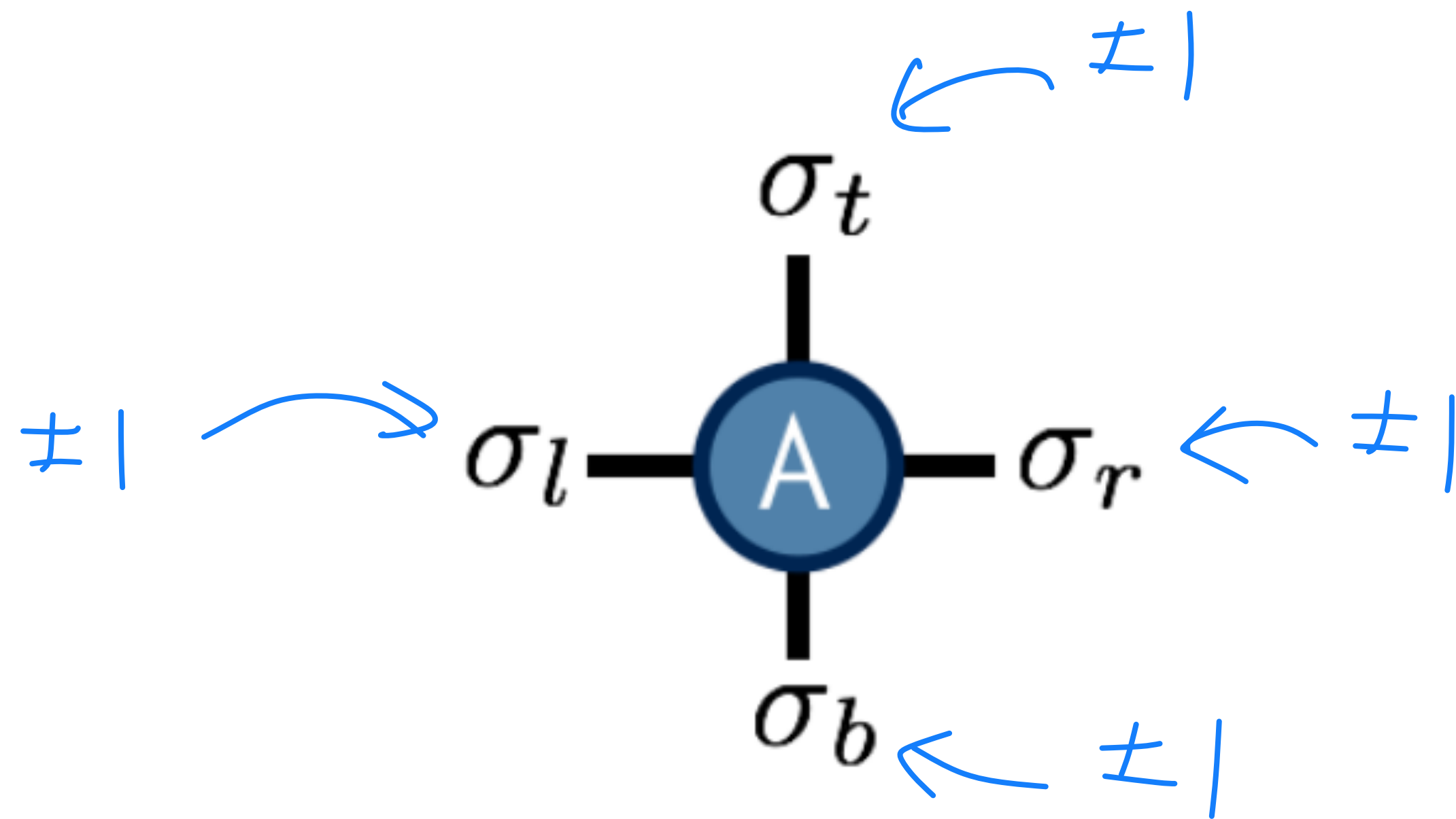
Tensor Network

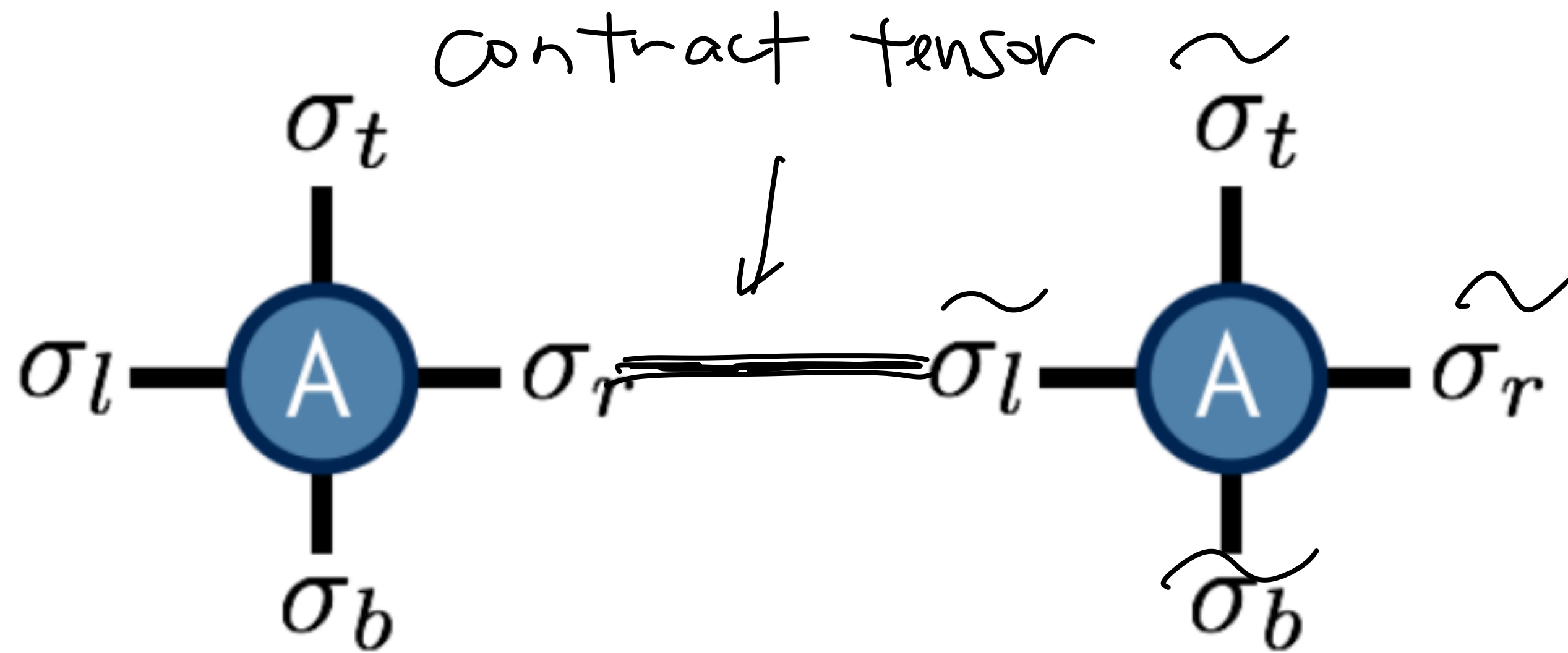
eg
Ising

$$Z = \sum_{\{\sigma_i\}} e^{-\sum_{\langle ij \rangle} \sigma_i \sigma_j} / T$$



$$A^{\sigma_t \sigma_r \sigma_b \sigma_l} = e^{-(\sigma_t \sigma_r + \sigma_r \sigma_b + \sigma_b \sigma_l + \sigma_l \sigma_t)/T}$$

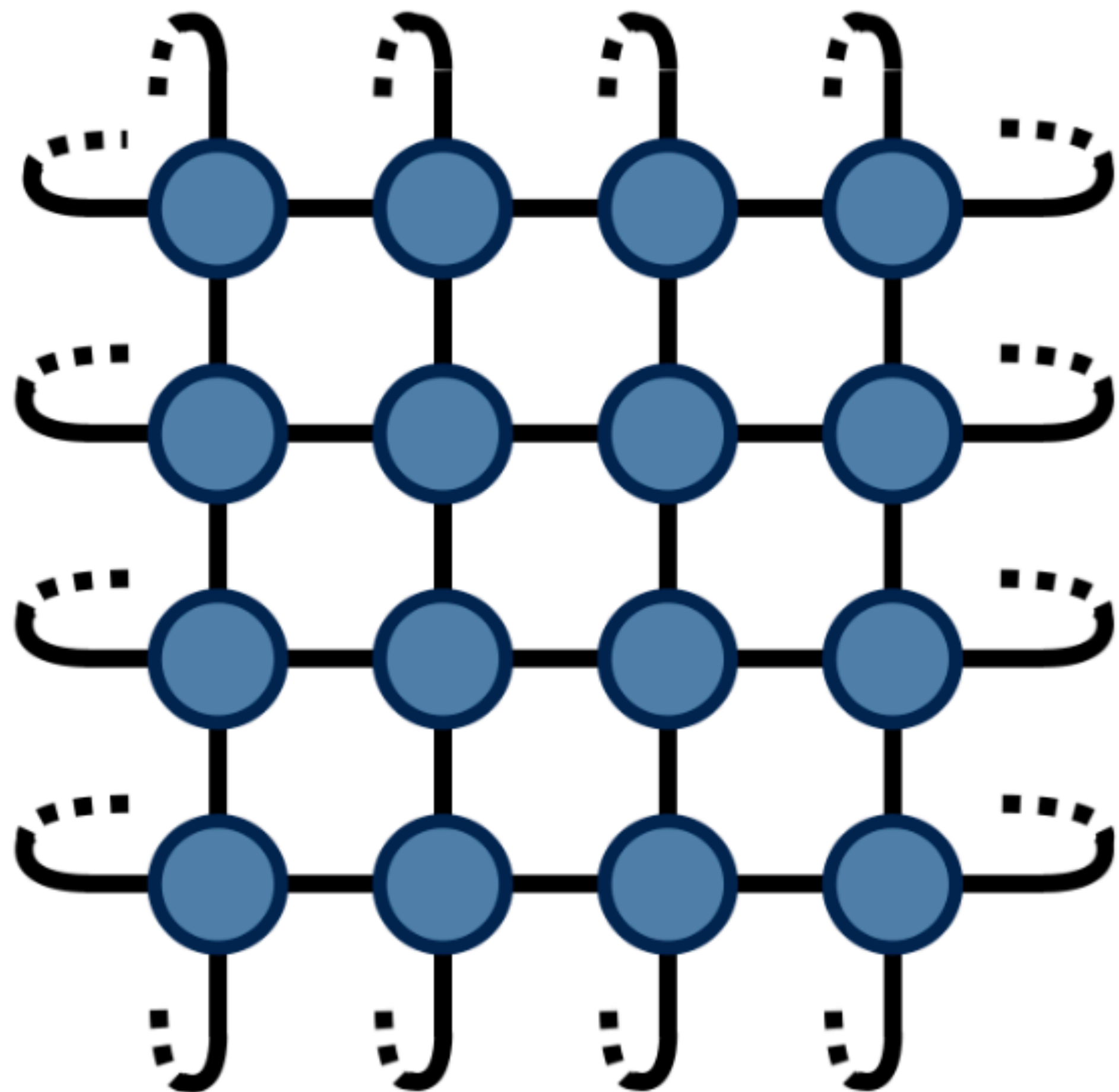




$$\sum_{\sigma_r = \tilde{\sigma}_l} A^{\sigma_t \sigma_r \sigma_b \sigma_l} \sim A^{\tilde{\sigma}_t \tilde{\sigma}_r \tilde{\sigma}_b \tilde{\sigma}_l}$$

Z

\equiv



\equiv

Tr

(transfer matrix)^L

Many ingredients for integrable models:

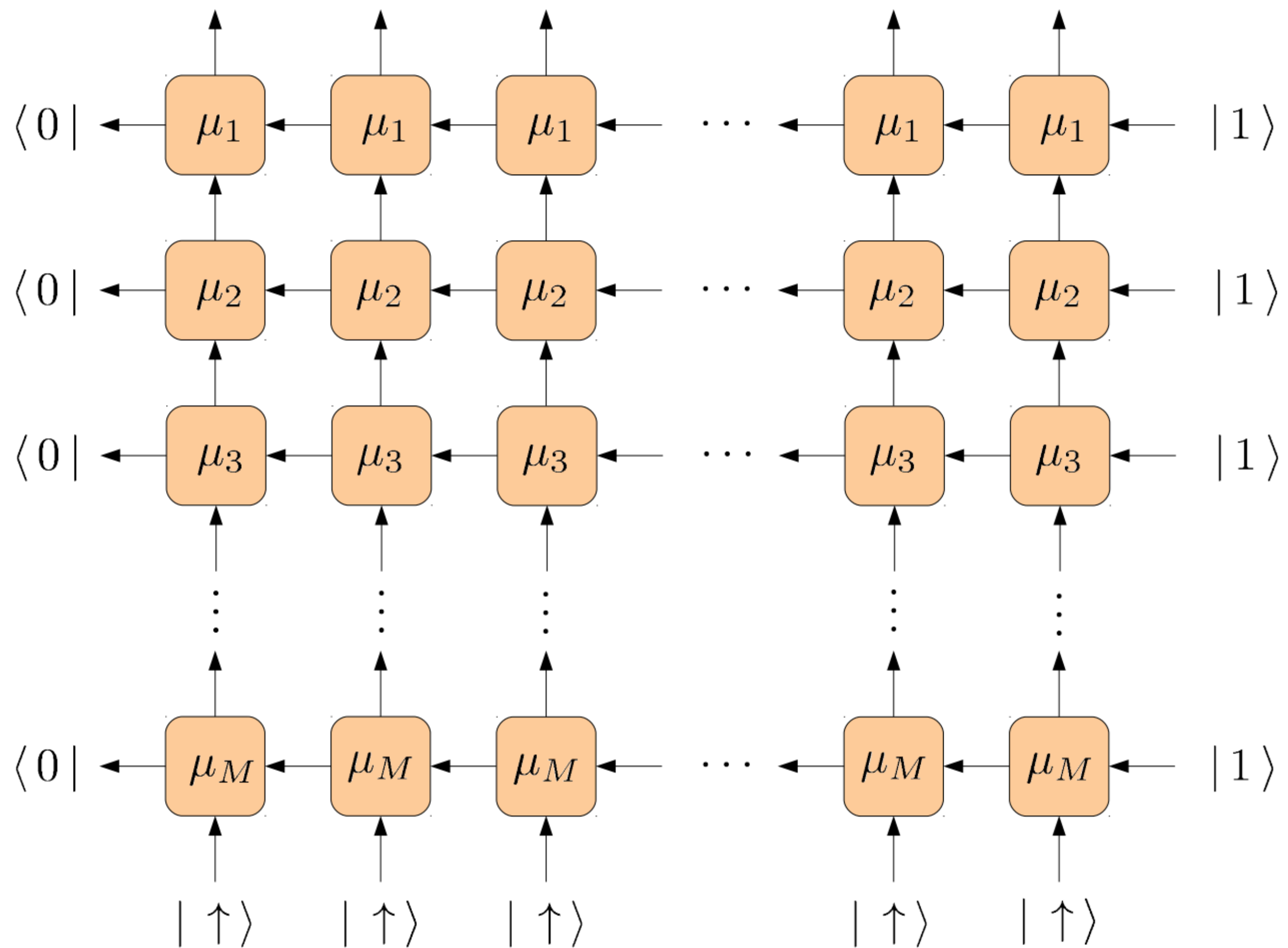
reformulated in terms of tensor networks

e.g.

Bethe state is

a MPS

{ Katsura-Maruyama ('09)
Murg-Korepin-Verstraete ('12) }

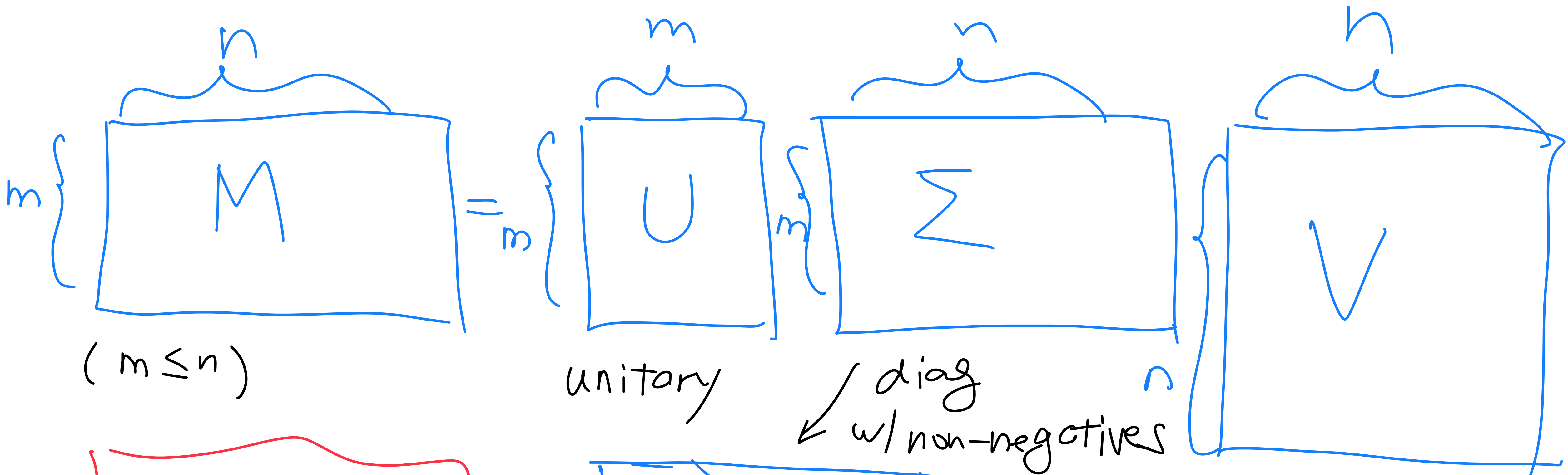


RG flow in Tensor Networks?

- modern incarnation of Kadanoff-type RG
- comes in many variants e.g.
 - TRG [Levin-Nave ('07)]
 - TNR [Evenbly-Vidal ('15), cf. Gu-Wen ('09)]
 - Loop-TNR [Yang-Gu-Wen ('17)]
 - Gilt-TNR [Hauke-Delcamp-Mizera ('17)]
 - etc.

TEFR

Singular Value Decomposition (SVD)



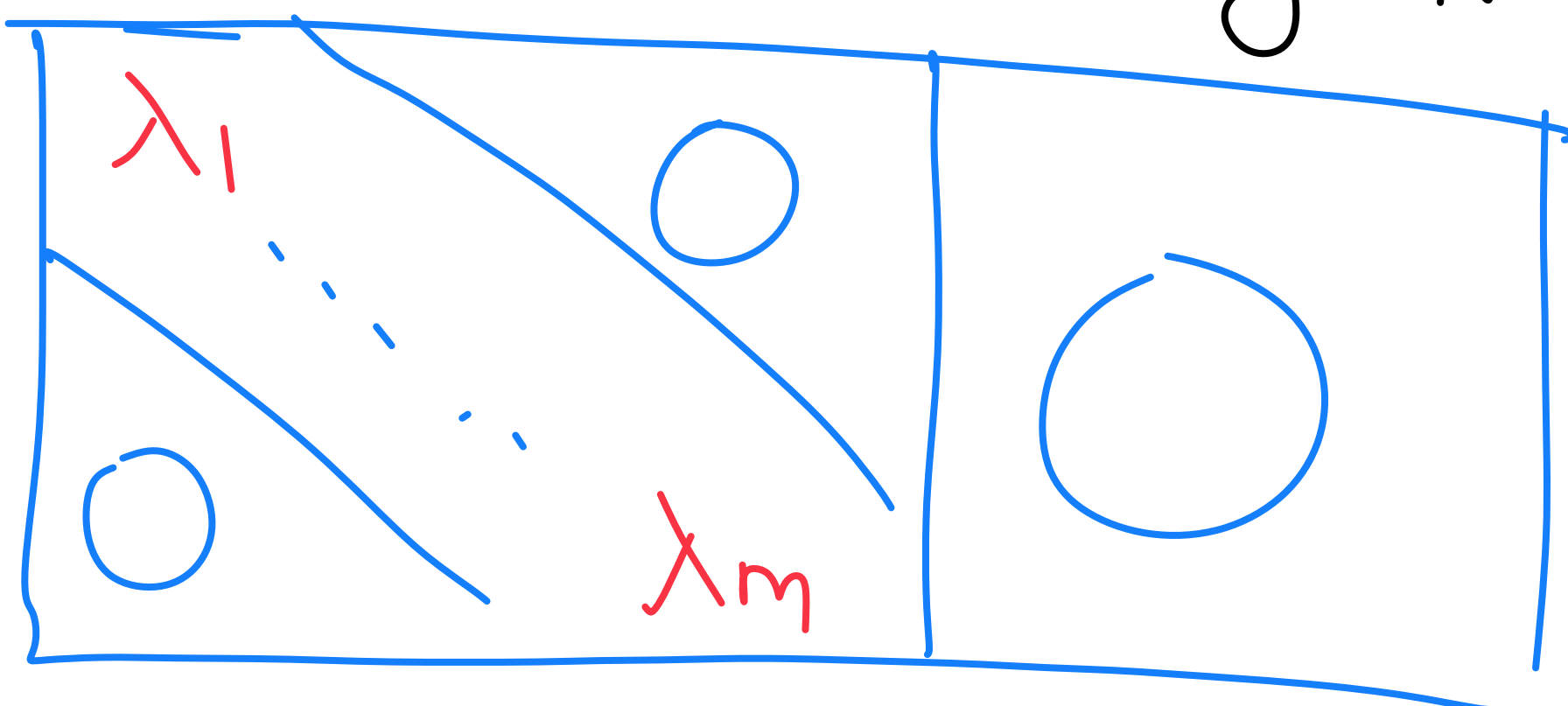
$(m \leq n)$

unitary

diag
w/ non-negatives

unitary

λ_i : singular values



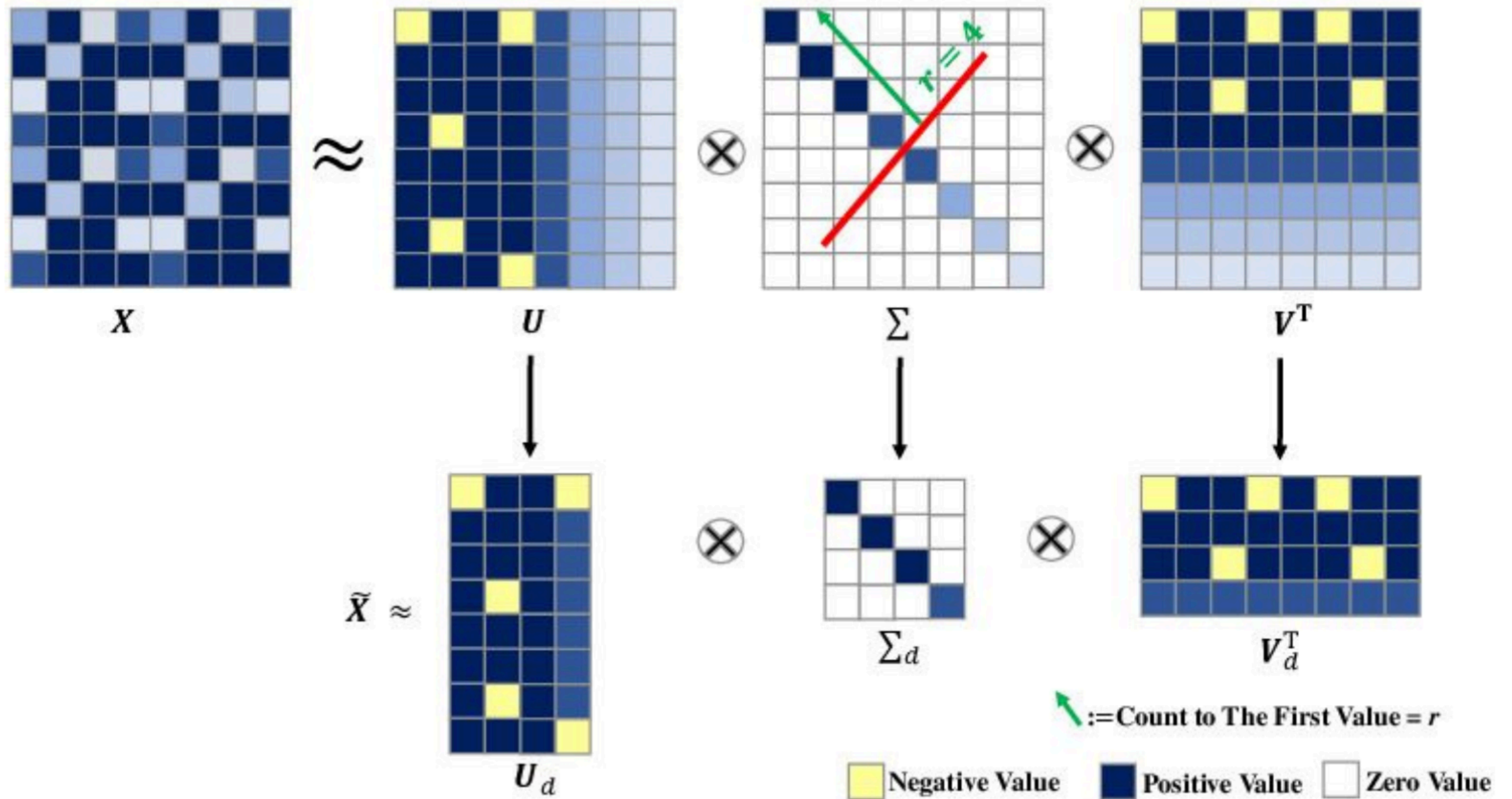


Figure borrowed from <https://ai-artificial-intelligence.webyes.com.br/singular-value-decomposition-svd/>

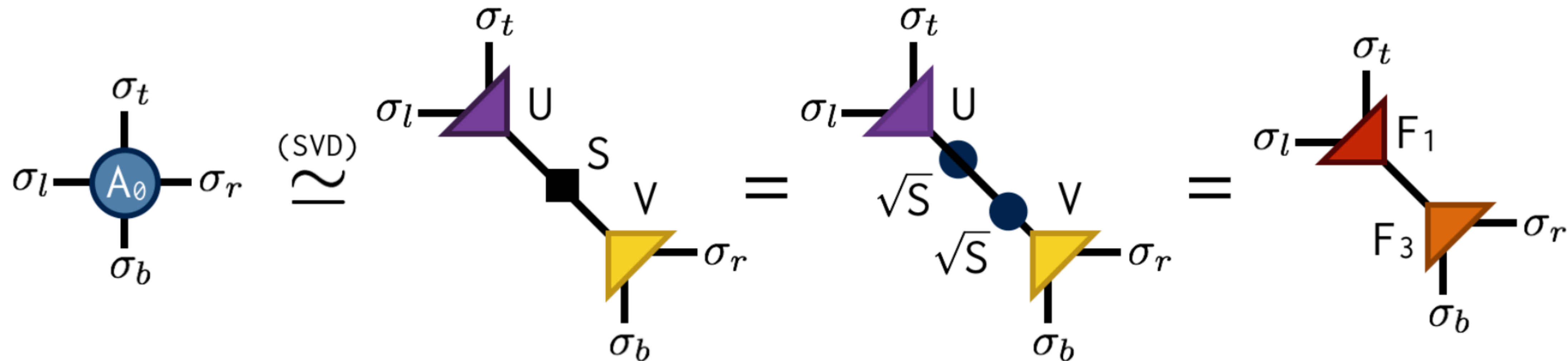
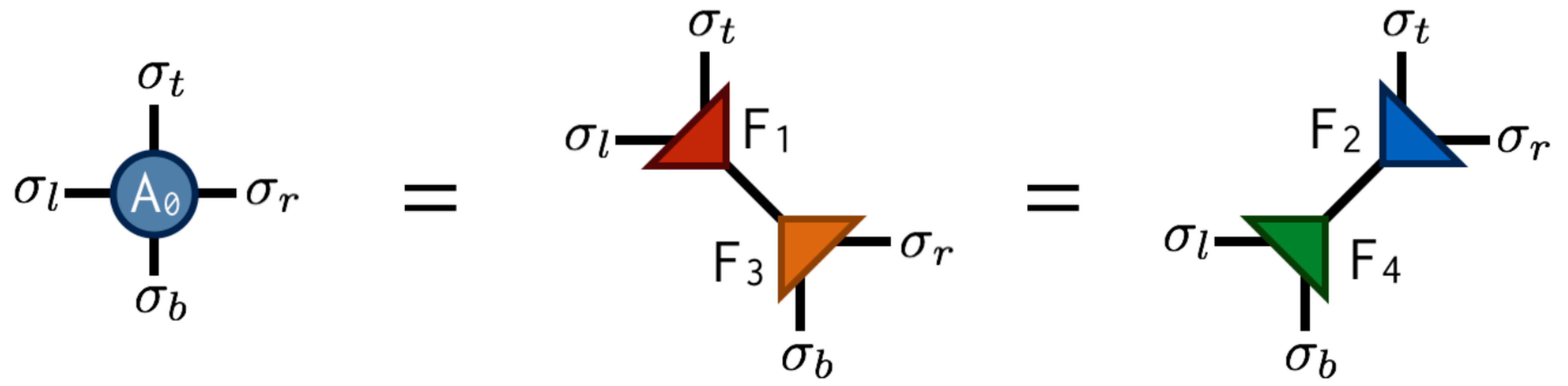
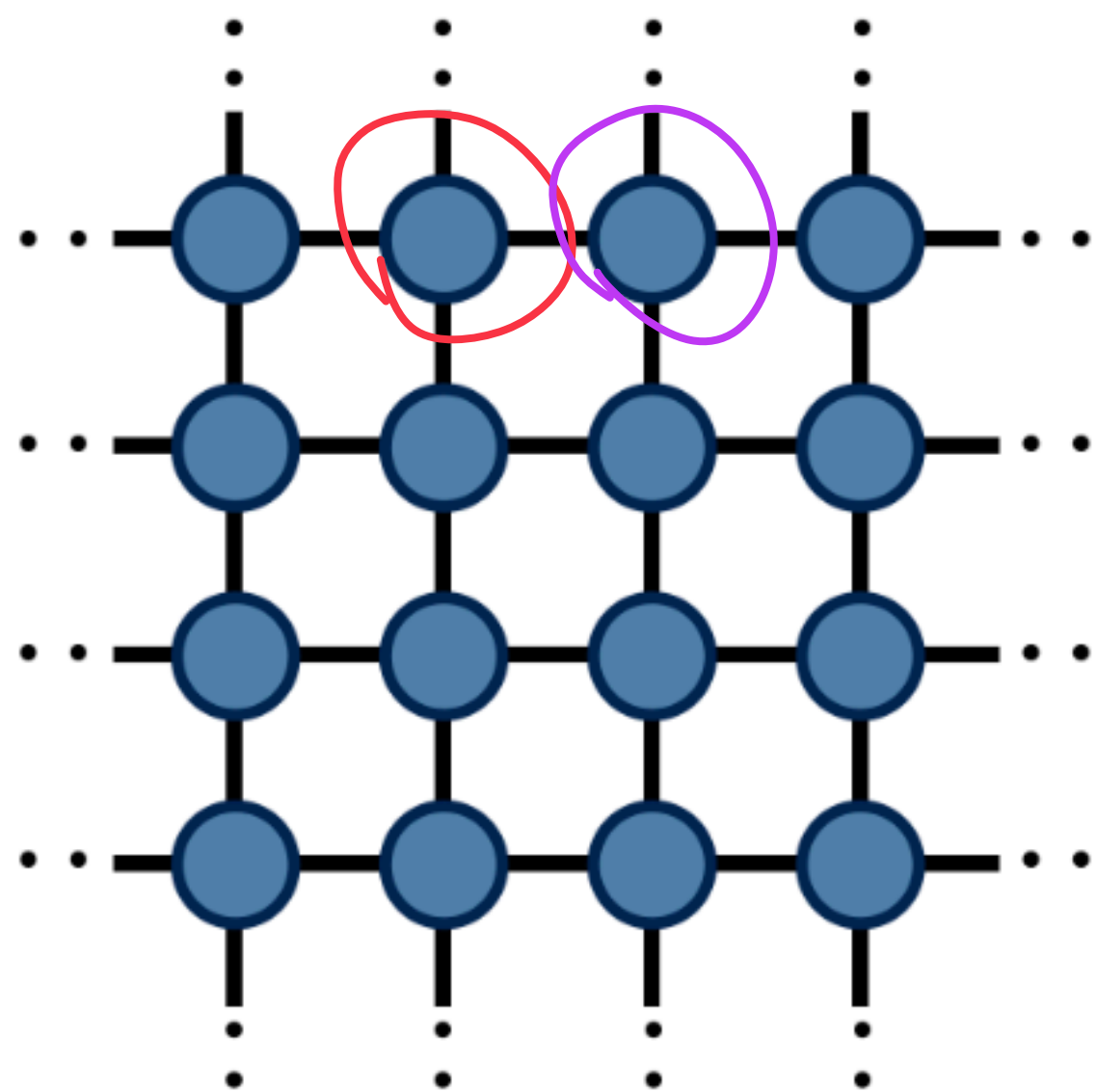
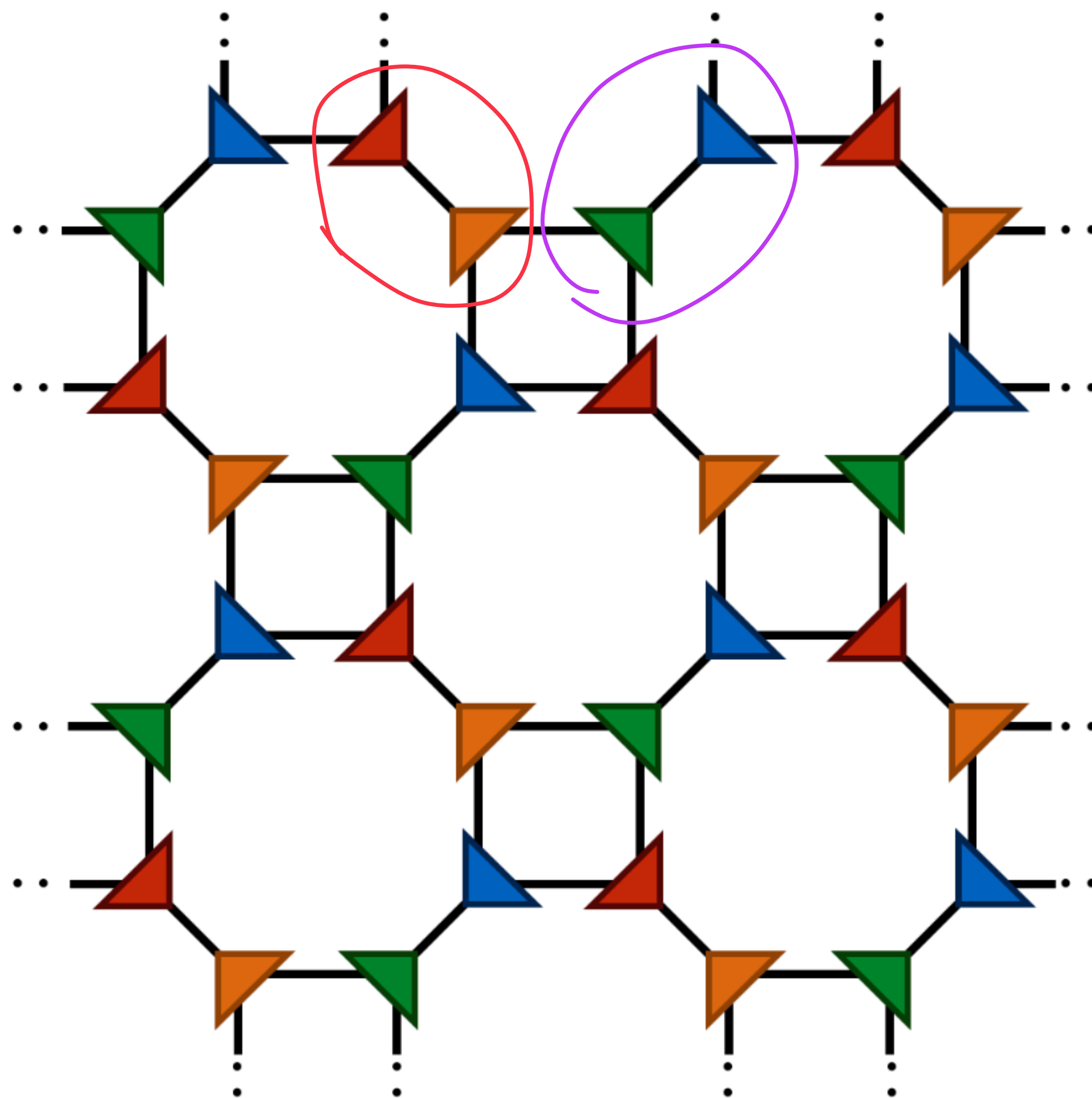


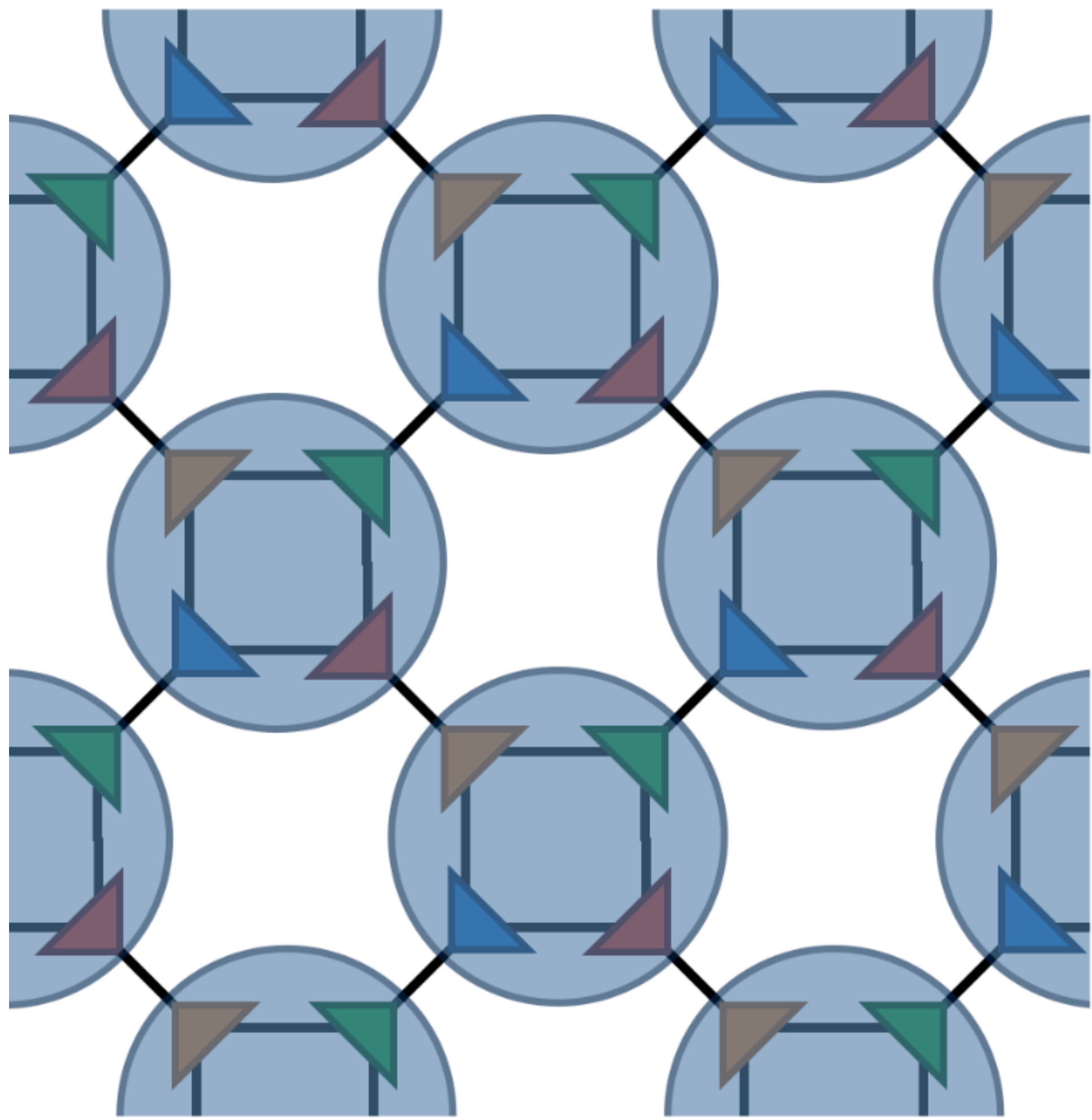
Figure borrowed from <https://tensornetwork.org/trg/>



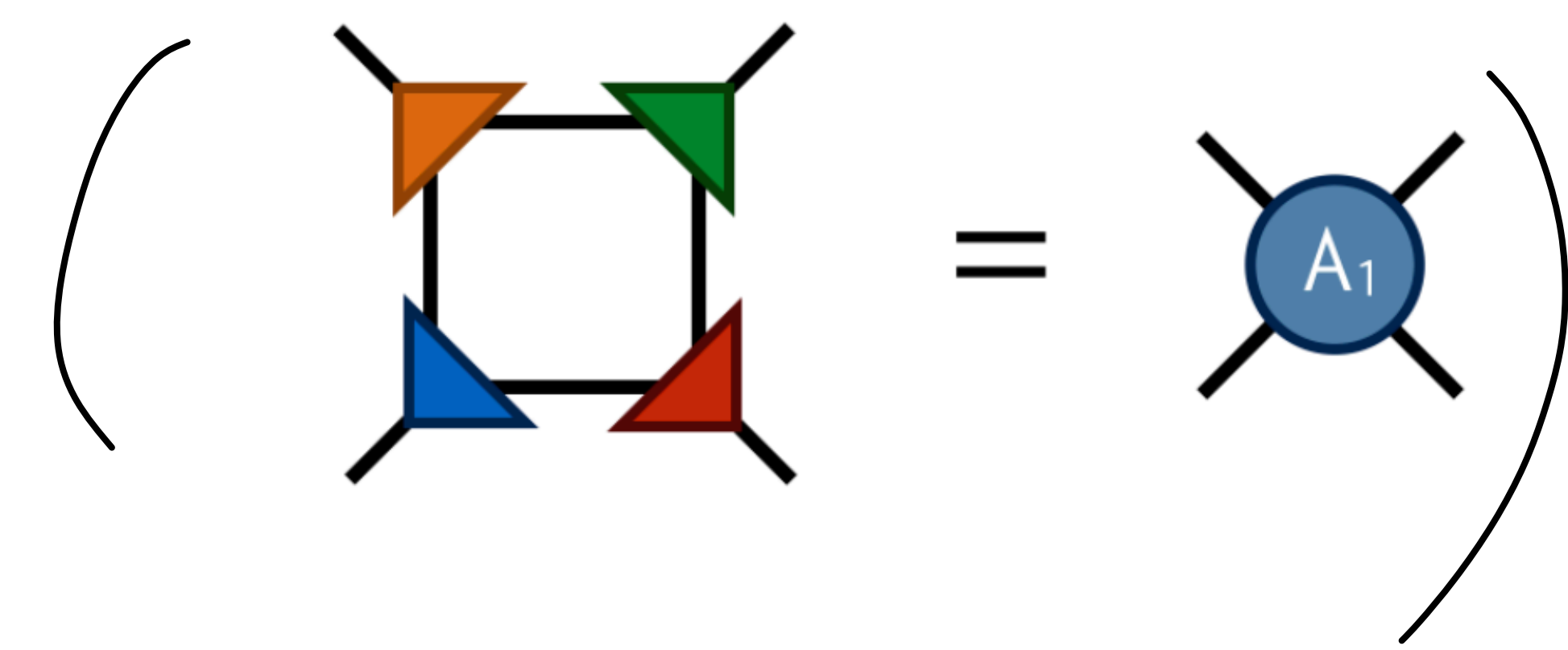
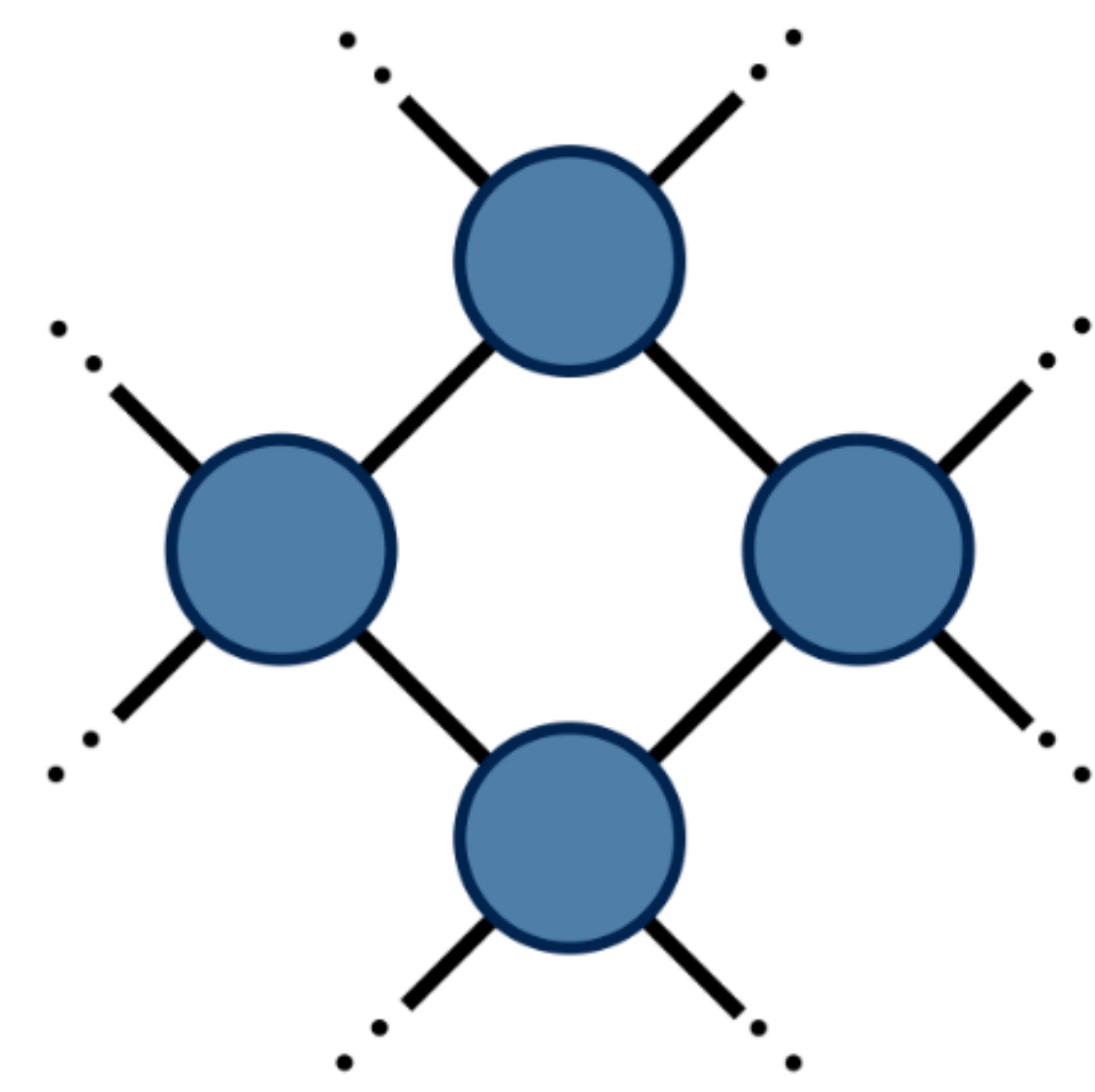


=



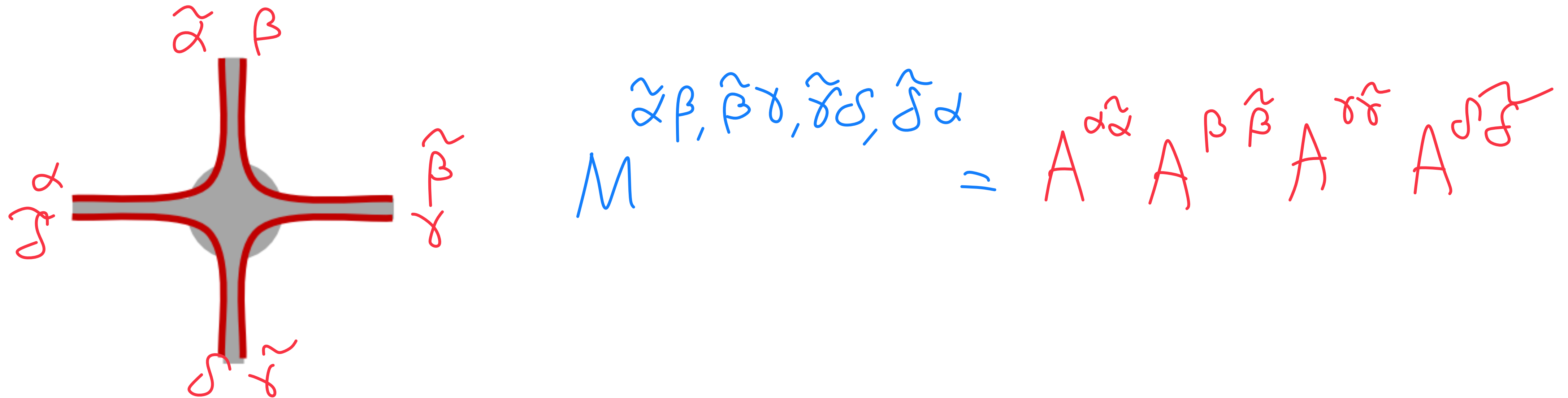


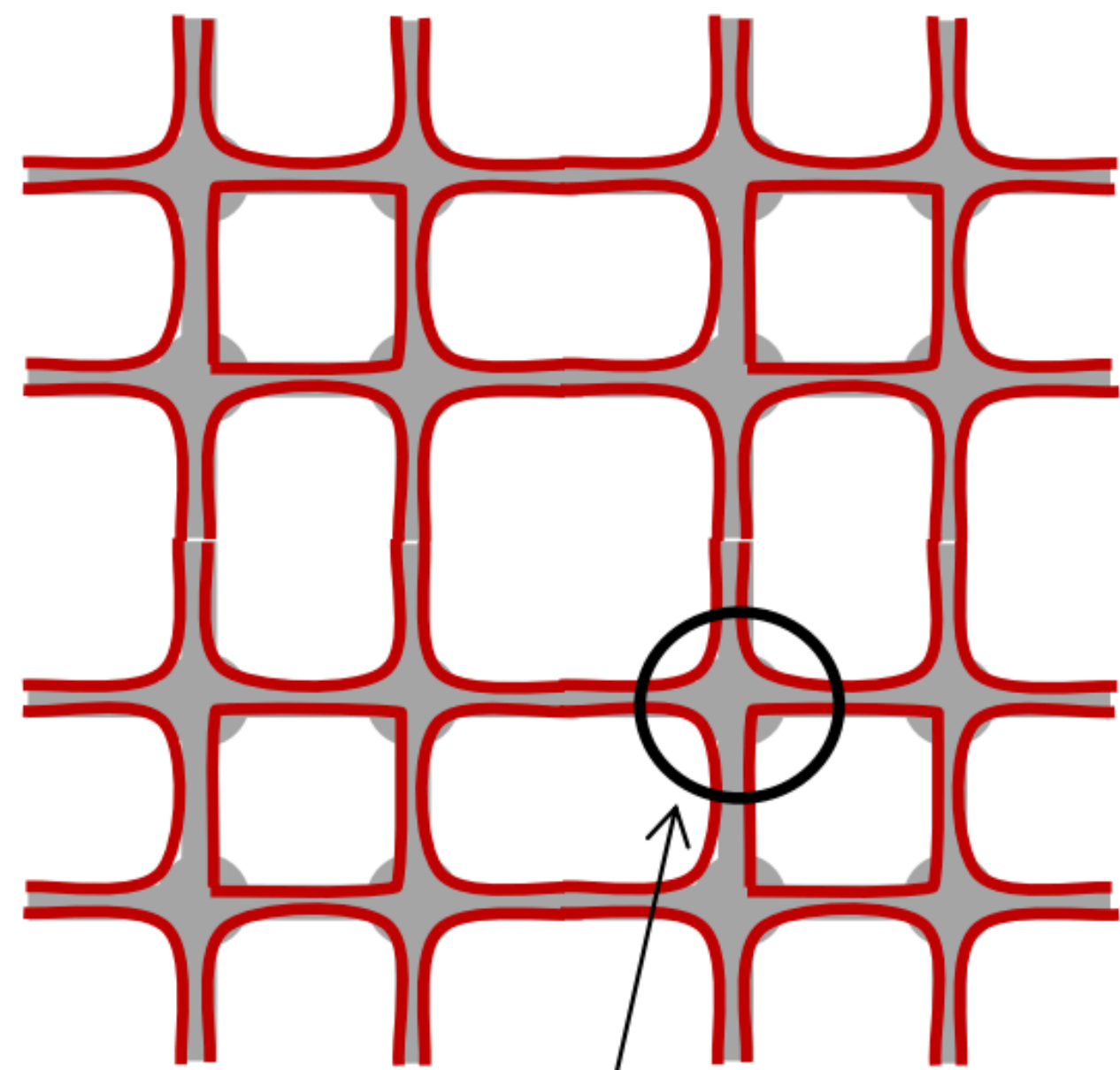
=



(Caveat: TRG does not remove some high-scale entanglement [Levin])

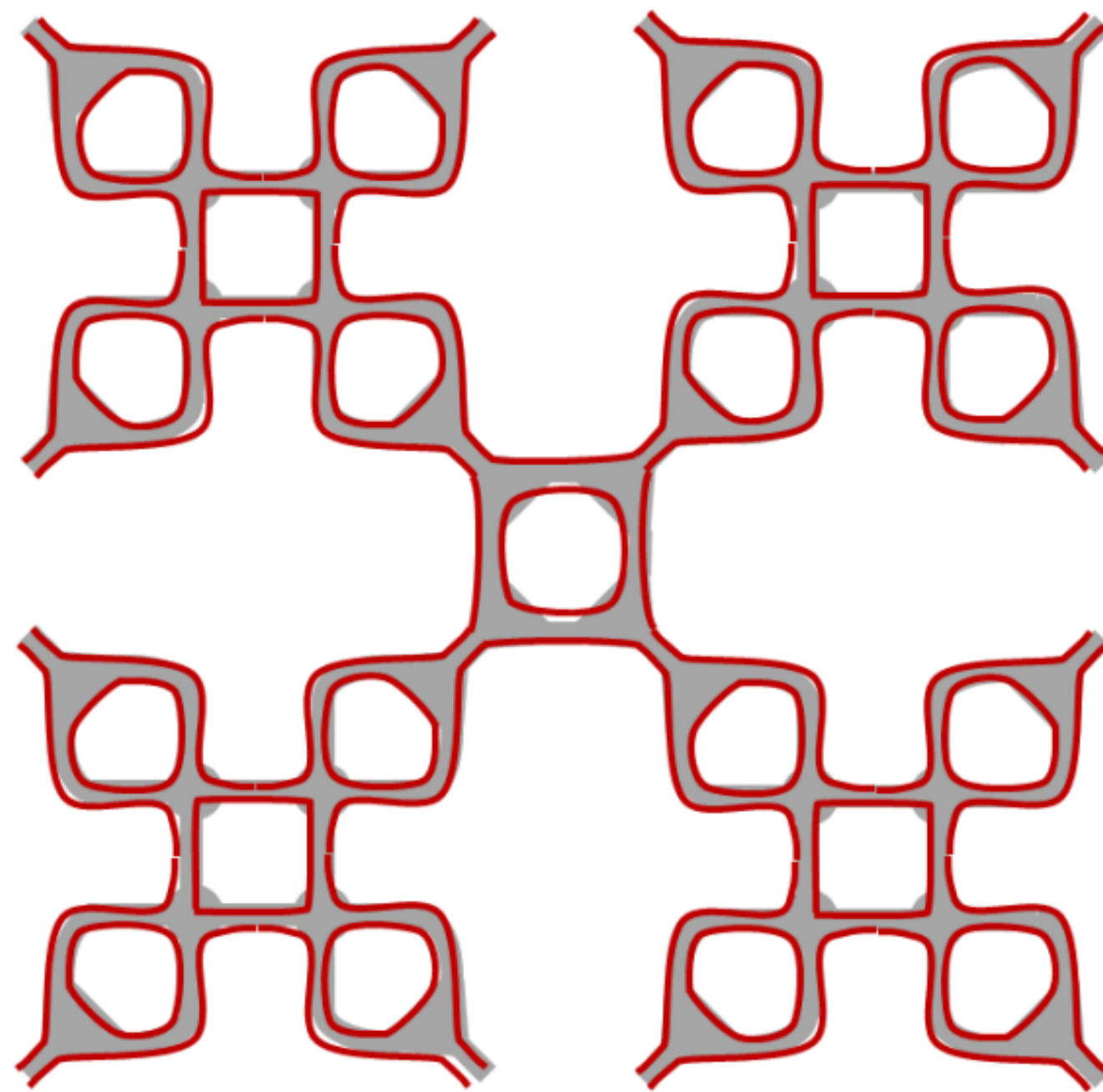
- Corner-Double Line (CDL) tensor



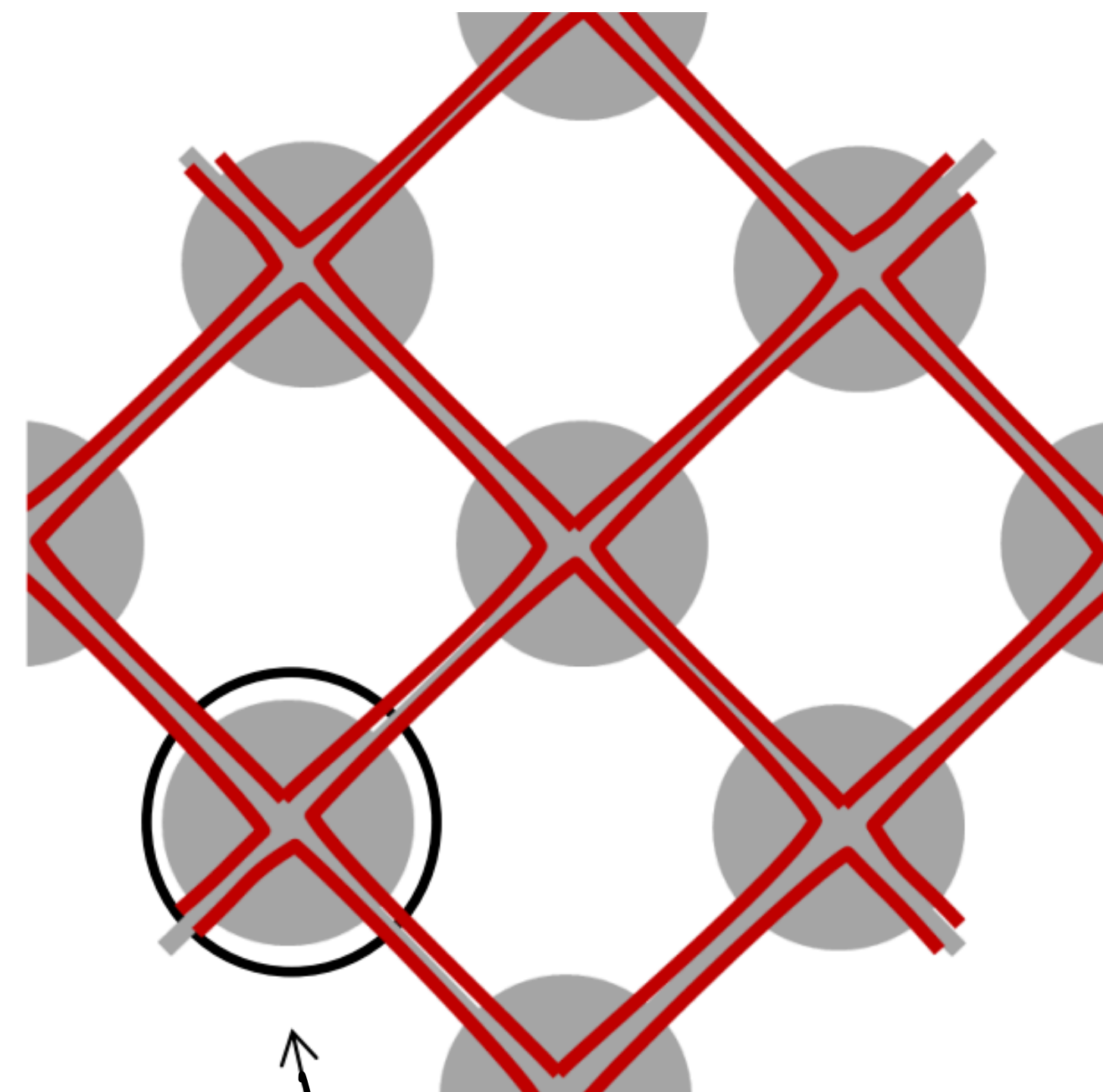


original
tensor

\approx

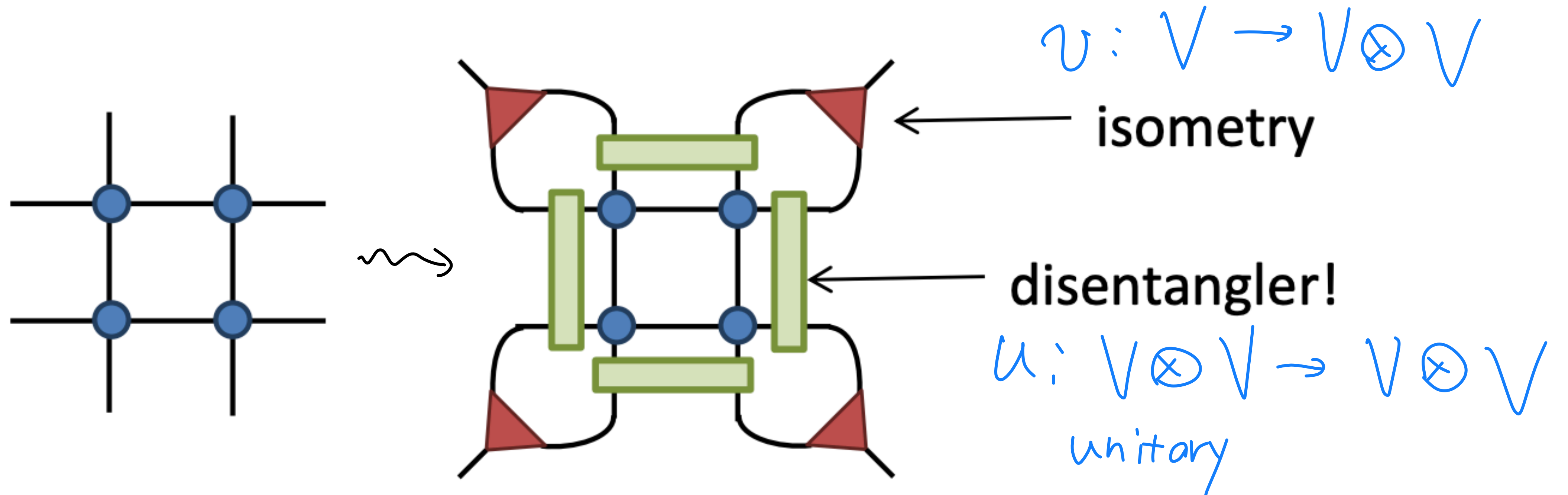


$=$



new
tensor

Resolution: TNR [Evently - Vidal] (cf. MERA [Vidal])



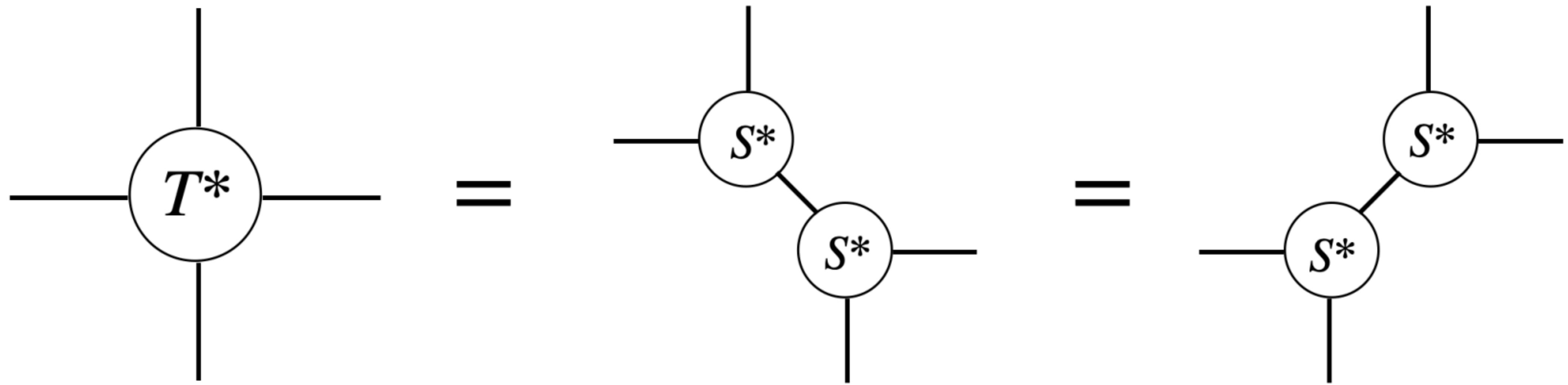
(1+1) dim.

CFT data from TN RG

[Vedda-MY, 2307.02523 [hep-th]]

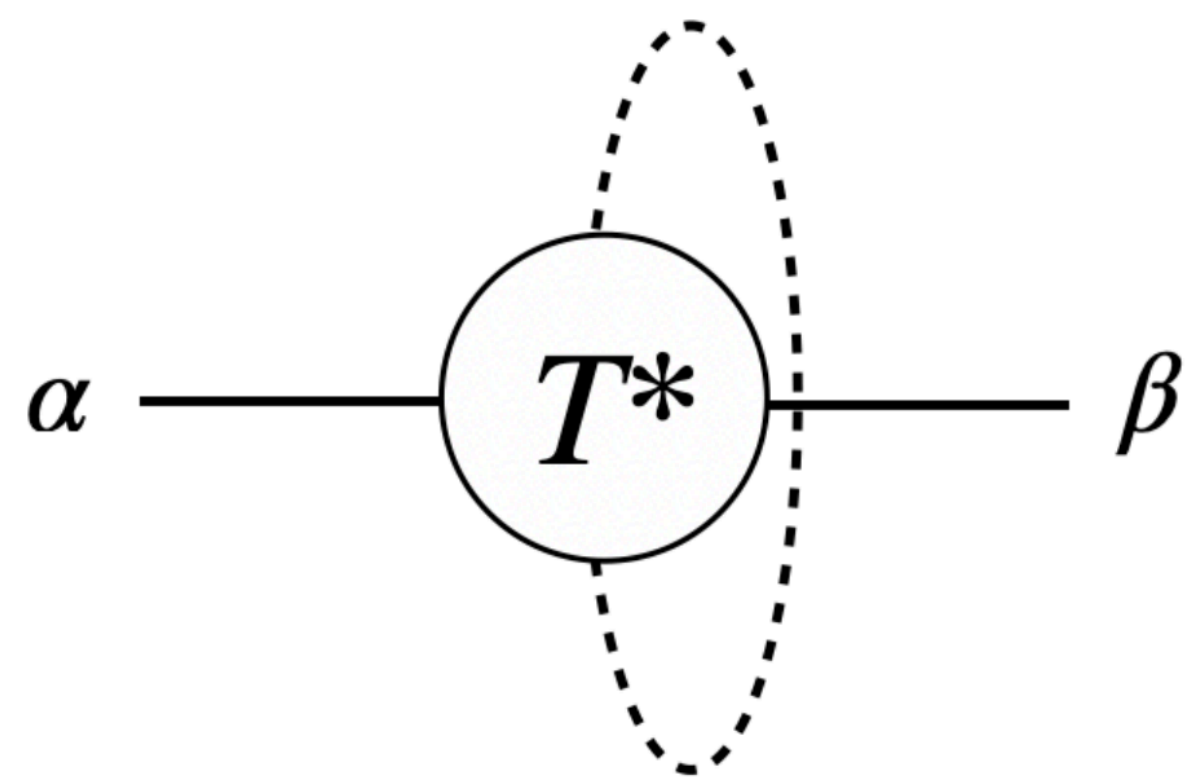


Endpoint of RG = Fixed-Point Tensor



Q: CFT data?

Before our work ...



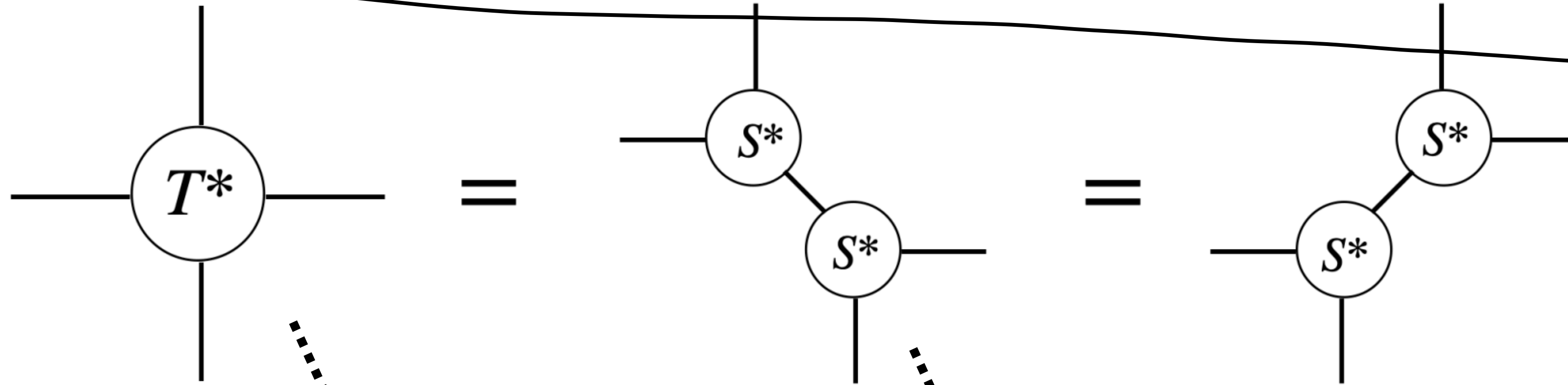
$$= \delta_{\alpha\beta} e^{-2\pi\Delta_\alpha}$$

Operator dimension
& central charge

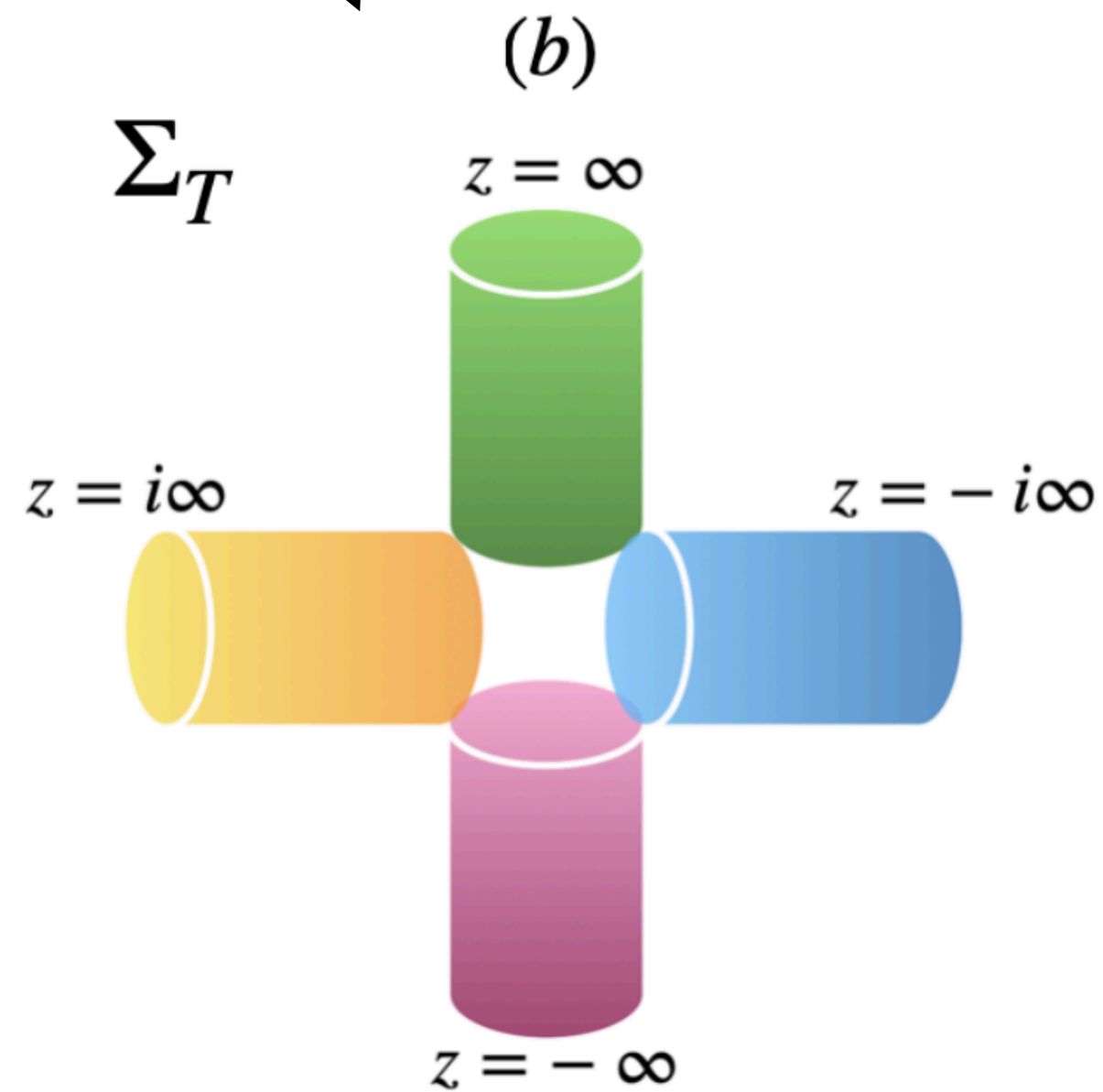
[Gai-Wen (09)]

OPE data not clear-cut
(3-pt function)

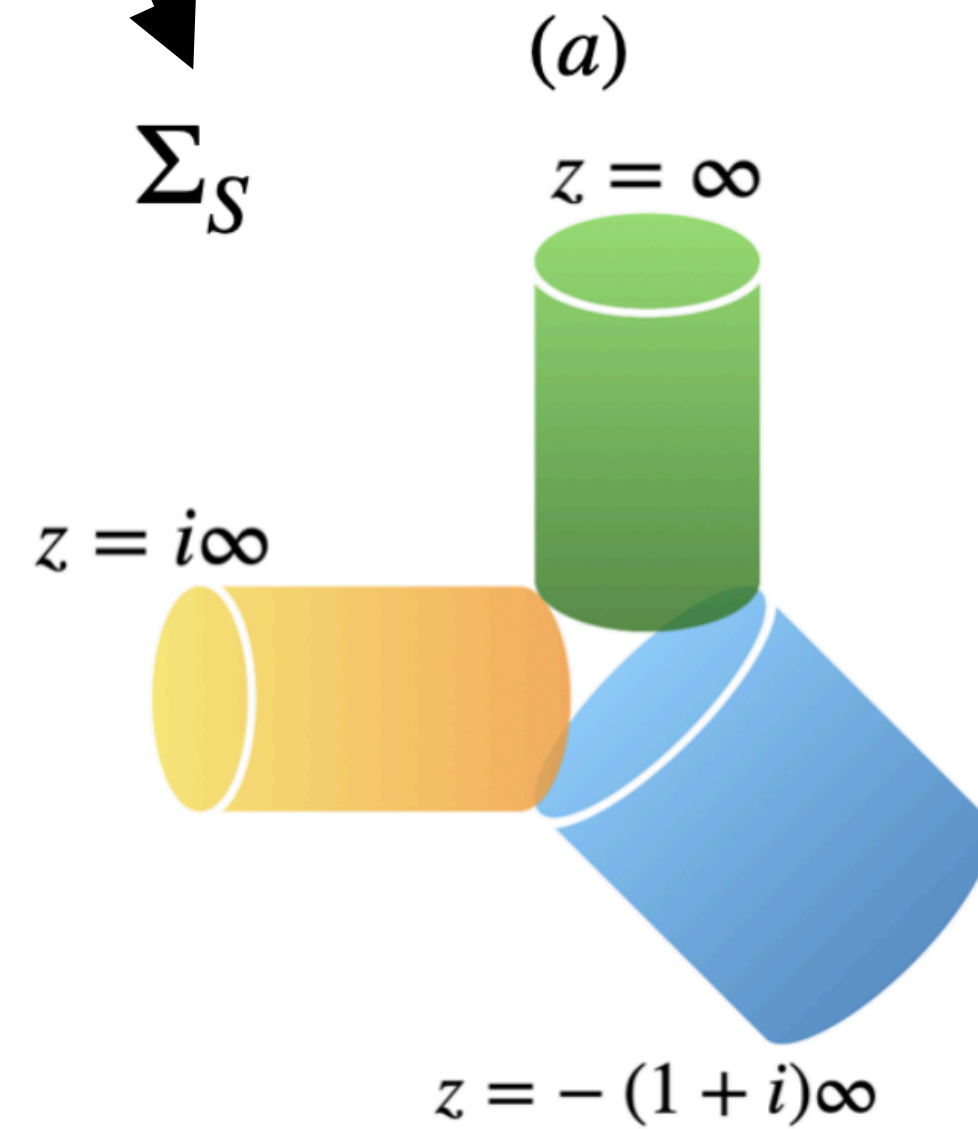
It seems natural to regard "tensor = spacetime"



“fatten”
 Σ_T



“fatten”
 Σ_S



$$\left(\begin{array}{l} \frac{S_{\alpha\beta\gamma}^*}{S_{111}^*} = \langle \phi_\alpha(\infty)\phi_\beta(i\infty)\phi_\gamma(-(1+i)\infty) \rangle_{\Sigma_S} \\ \frac{T_{\alpha\beta\gamma\delta}^*}{T_{1111}^*} = \langle \phi_\alpha(-\infty)\phi_\beta(i\infty)\phi_\gamma(\infty)\phi_\delta(-i\infty) \rangle_{\Sigma_T} \end{array} \right. \quad \begin{array}{l} \mathcal{Z}_S = \infty, i\infty, -(1+i)\infty \\ \mathcal{Z}_T = \pm\infty, \pm i\infty \end{array}$$

$$z_S = \frac{L}{2\pi} [-\ln(w-i) - i\ln(w+1) + (1+i)\ln w]$$

$$z_T = \frac{L}{2\pi} \left[\ln\left(\frac{w+i}{w-i}\right) + i\ln\left(\frac{w-1}{w+1}\right) \right]$$

$$\left(\begin{array}{l} \frac{S_{\alpha\beta\gamma}^*}{S_{111}^*} = \langle \phi_\alpha(-1)\phi_\beta(i)\phi_\gamma(0) \rangle_{\text{pl}} \prod_{n \in (\alpha, \beta, \gamma)} |J_n|^{\Delta_n} \\ \frac{T_{\alpha\beta\gamma\delta}^*}{T_{1111}^*} = \langle \phi_\alpha(-1)\phi_\beta(i)\phi_\gamma(1)\phi_\delta(-i) \rangle_{\text{pl}} \prod_{n \in (\alpha, \beta, \gamma, \delta)} |J_n|^{\Delta_n} \end{array} \right. \quad \begin{array}{l} \omega_S = i, -1, 0 \\ \omega_T = \pm i, \pm 1 \end{array}$$

★ Our proposal in Ueda-MY 2307.02523 [hep-th]

$$\left(\frac{S_{\alpha\beta\gamma}^*}{S_{111}^*} = e^{-\frac{\pi}{4}(\Delta_\alpha + \Delta_\beta + \Delta_\gamma)} \langle \phi_\alpha(-1)\phi_\beta(i)\phi_\gamma(0) \rangle_{\text{pl}} \right.$$

$$\frac{T_{\alpha\beta\gamma\delta}^*}{T_{1111}^*} = \left(\frac{e^{\frac{\pi}{2}}}{2} \right)^{\overbrace{-\Delta_{\text{tot}}}^{\uparrow}} \langle \phi_\alpha(-1)\phi_\beta(i)\phi_\gamma(1)\phi_\delta(-i) \rangle_{\text{pl}}$$

$$\Delta_\alpha + \Delta_\beta + \Delta_\gamma + \Delta_\delta$$

i.e.

$$\left(\frac{S_{\alpha\beta\gamma}^*}{S_{111}^*} = \langle \phi_\alpha(-x_S)\phi_\beta(ix_S)\phi_\gamma(0) \rangle_{\text{pl}} \right.$$

$$\chi_S = e^{\frac{\pi}{4}}$$

$$\frac{T_{\alpha\beta\gamma\delta}^*}{T_{1111}^*} = \langle \phi_\alpha(-x_T)\phi_\beta(ix_T)\phi_\gamma(x_T)\phi_\delta(-ix_T) \rangle_{\text{pl}}$$

$$\chi_T = e^{\frac{\pi}{2}}/2$$





We can implement TRG / TNR

& Extract CFT data

$\{\Delta_\alpha\}$ $\{c_{\alpha\beta\gamma}\}$


for e.g. Ising / Potts models



TRG code for the Ising model available from https://github.com/dartsushi/TRG_D4_symmetry


 TRG_analysis-Ising.ipynb	func_fixed	last year
 entanglement_filtering.py	base	last year
 opt_3leg.py	base	last year
 util.py	base	last year

No packages published

Languages



-  Jupyter Notebook 95.9%
-  Python 4.1%

 **README**

TRG_D4_symmetry

This repository provides numerical details of the paper "[Fixed-point tensor is a CFT four-point function](#)" by A.Ueda and M.Yamazaki.

Preprocessed data are available in the directories `"/fptensor"` and `"/Gauge-fixed"`.

If you would like to compute the data by yourself, `"Data_collection.ipynb"` gives the instructions.

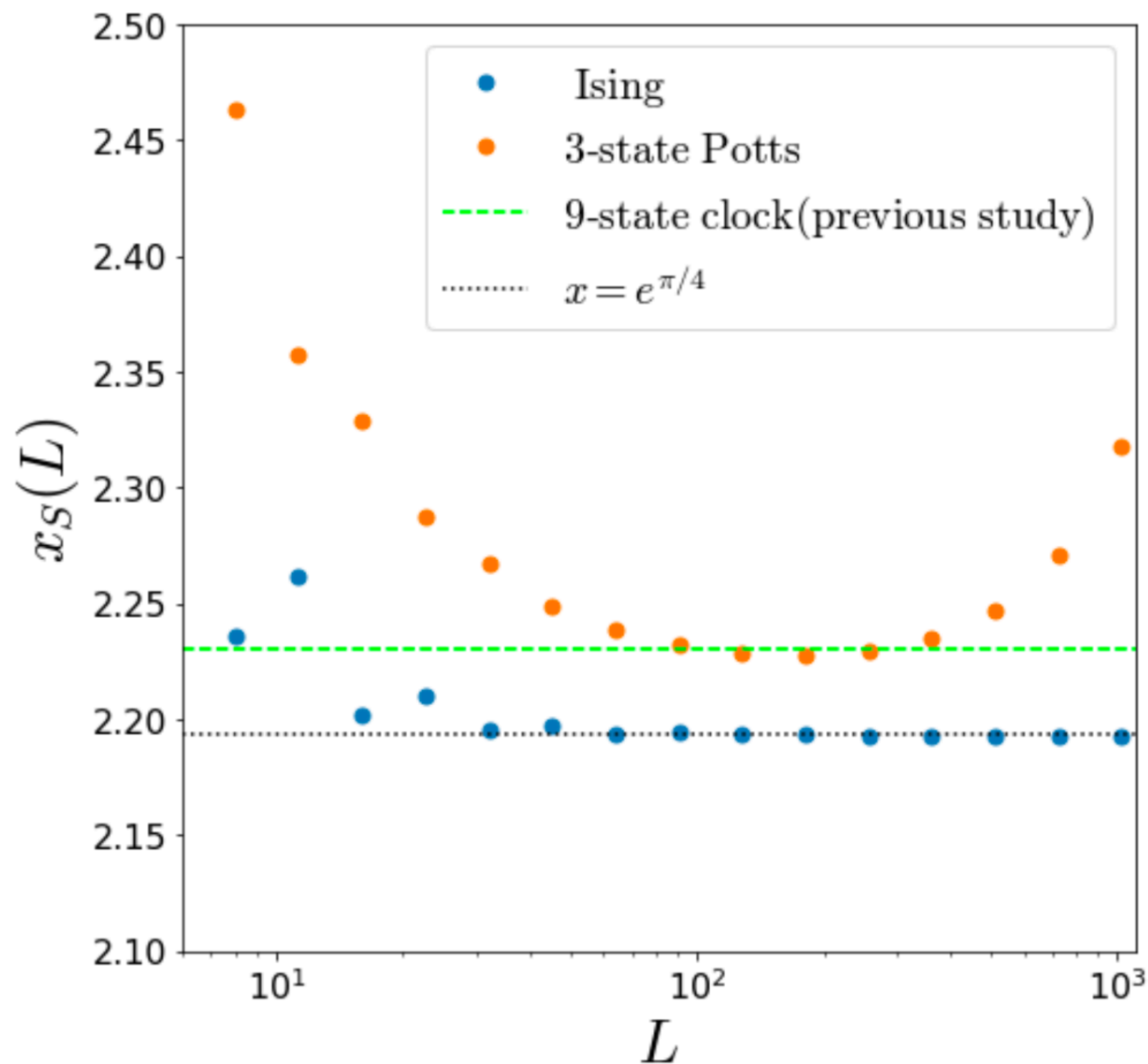
The main figures in our paper are plotted in `"TRG_analysis.ipynb"`.

(2D Ising model)

	Tensor RG	Exact
	$T_{\alpha\beta\gamma\delta} (L = 2048)$	$\langle \phi_\alpha \phi_\beta \phi_\gamma \phi_\delta \rangle$
1111	1	1
$\sigma\sigma\sigma\sigma$	0.610	0.645
$\sigma\sigma\epsilon\epsilon$	0.0714	0.0716
$\sigma\epsilon\sigma\epsilon$	0.000	0
$\epsilon\epsilon\epsilon\epsilon$	0.0168	0.0168
$\sigma\sigma\epsilon 1$	0.0618	0.0765
$\sigma\epsilon\sigma 1$	0.133	0.140
$\sigma\sigma\sigma 1$	0.000	0
$\epsilon\epsilon\epsilon 1$	0.001	0
$\sigma\sigma 11$	0.708	0.736
$\sigma 1\sigma 1$	0.639	0.675
$\epsilon\epsilon 11$	0.0863	0.0864
$\epsilon 1\epsilon 1$	0.0439	0.0432
$\epsilon\sigma 11$	0.000	0

When we fit \mathcal{C}_S

$$\frac{S_{\alpha\beta\gamma}^*}{S_{111}^*} = \langle \phi_\alpha(-x_S) \phi_\beta(ix_S) \phi_\gamma(0) \rangle_{pl}$$



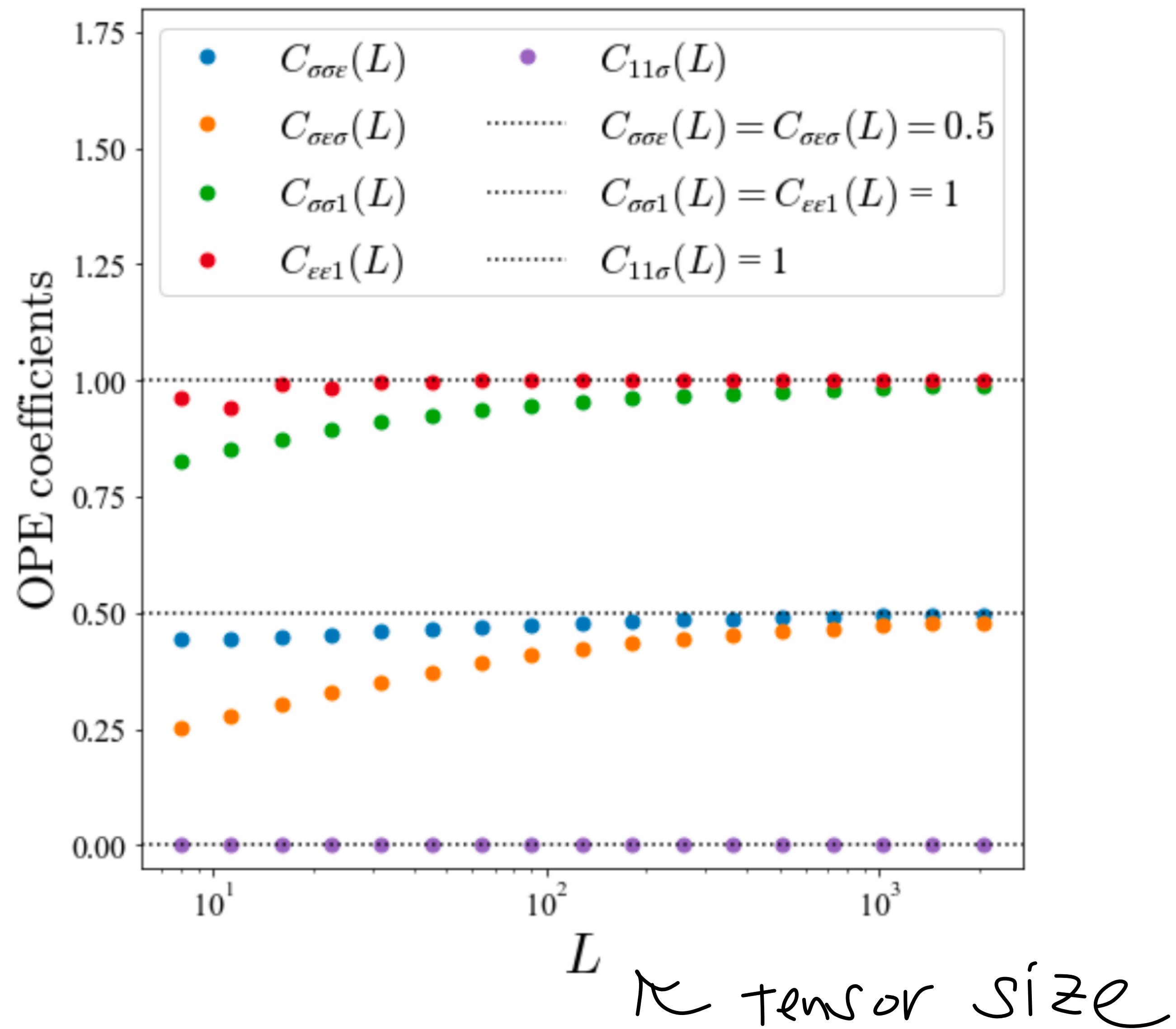
[Li-Pai-Gu '22]

← 2.23035

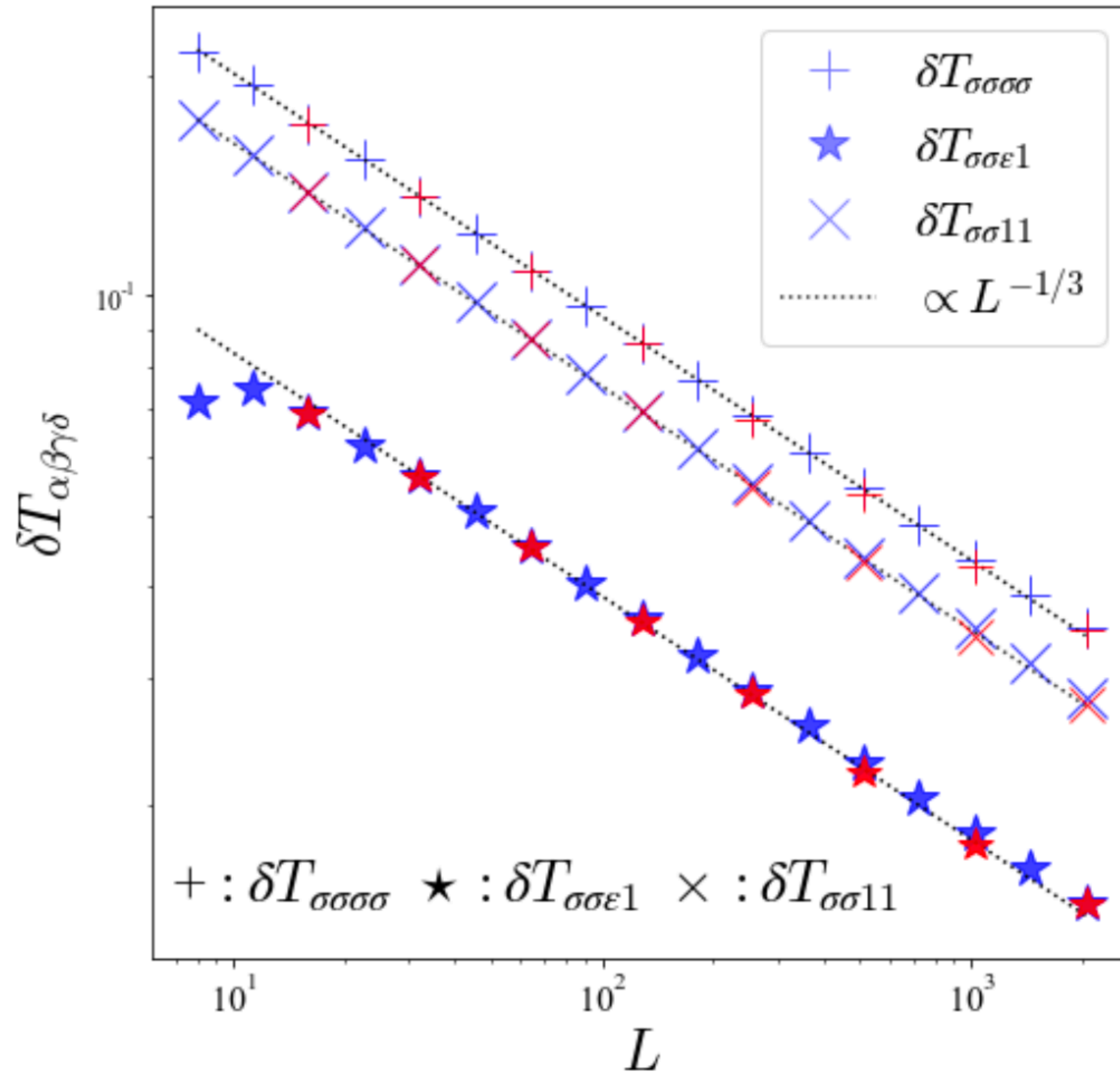
← 2.193257

↑

Our value



finite size effect



Summary

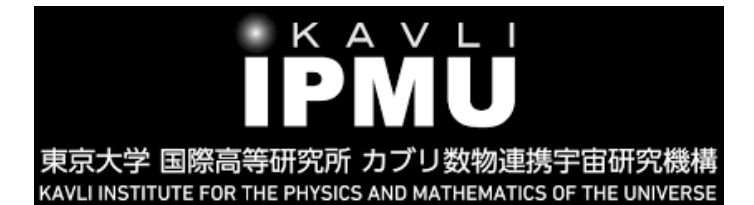
- * Tensor RG : powerful to study RG flow
- * We can numerically extract full data of 2D CFT
defining
- * Can follow RG flow

Outlook

- * Generalizations? (e.g. $\text{dim} > 2$, c large)
- * RG flow? Numerical/Exact
- * Interplay with (near) integrability?
- * Holography?

“Focus Week on Non-equilibrium Dynamics,”
Sep. 30 - Oct.4, 2024, Kavli IPMU, Tokyo, Japan

Organizers: H. Katsura, Y. Miao, M. Oshikawa, M. Yamazaki



“High-Energy Physics in the Quantum Era,”
Dec. 2-4, 2024, KEK, Japan

Organizers: D. Grabowska, R. Harnak, S. Hashimoto,
M. Honda, R. Kitano, M. Yamazaki



“Exact Solvability and Quantum Information,”
Aug. 4-29, 2025, Les Houches, France

Organizers: S. Ouvry, T. Prosen, D. Serban, M. Yamazaki

