

# Towards tensor renormalization group study of lattice QCD

Atis Yosprakob

Department of Physics, Niigata University

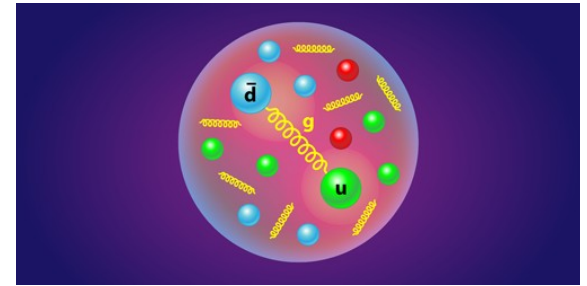
November 15<sup>th</sup>, 2024



# Lattice QCD

---

- non-perturbative formulation for quantum chromodynamics
- 4D Euclidean  $SU(3)$  gauge theory with  $N_f=2,3$ 
  - Higher dimensions, Non-abelian, Multiple flavors
- MC computation suffers from the **sign problem** at finite  $\theta$  and finite density
- MC computation also suffers from the **topology freezing** problem toward continuum limit

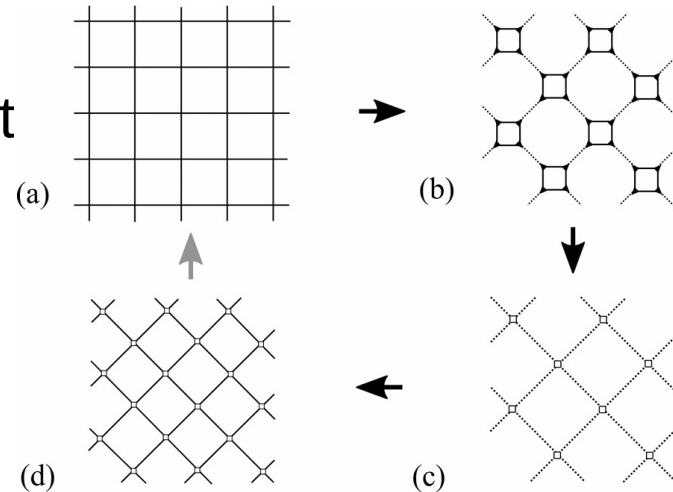


So far, we do not have a universal method that avoids all the problems...

# Tensor renormalization group (TRG)

---

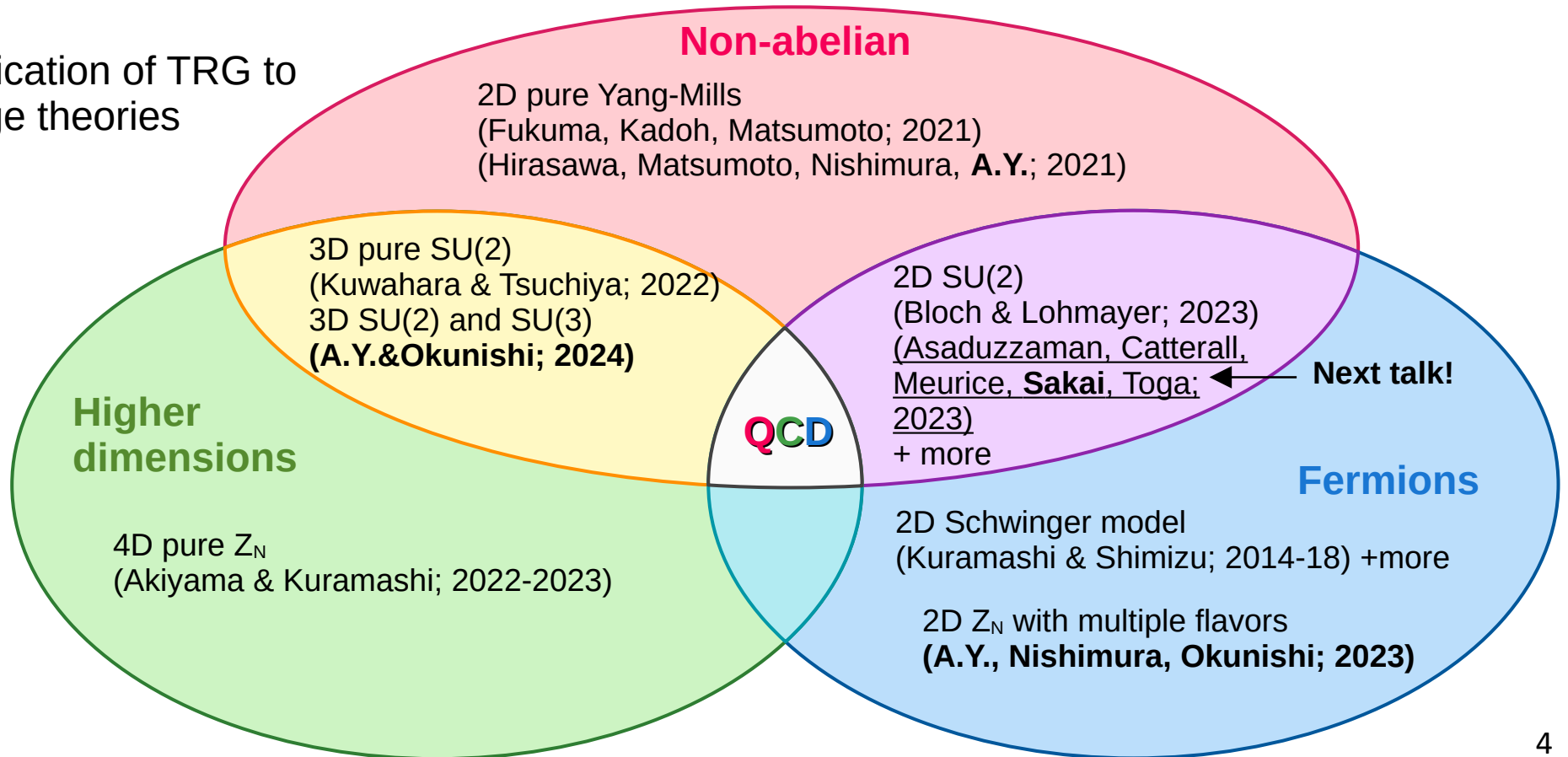
- An alternative to Monte Carlo methods based on coarse graining
- No sampling = **No sign problem**
- Can access large volumes with log cost
- Can handle fermion/Grassmann numbers directly; **Grassmann TRG**



[Figures from Okunishi-Nishino-Ueda; 2022]

# Progress toward TRG study of Lattice QCD

Application of TRG to gauge theories



# Challenges

---

- TRG can be challenging when the local Hilbert space is large
- By that, I meant QCD
  - Multiple fermion flavors  $\implies$  dimension  $\sim \exp(kN_f)$
  - Non-abelian gauge symmetry  $\implies$  Redundancy in the TN

I will talk about my works on these two directions.

# Outline

---

- Part I: Multi-flavor gauge theory
  - The multi-layer formulation
  - Initial tensor compression
  - Result: *finite density*  $N_f$ - flavor 2D  $Z_N$  theory
- Part II: Armillary sphere formulation
  - Degeneracy in the tensor network
  - Reduced tensor network formulation
  - Result: 3D SU(2) & SU(3) theory

# Part I: Multi-layer construction for multi-flavor gauge theory

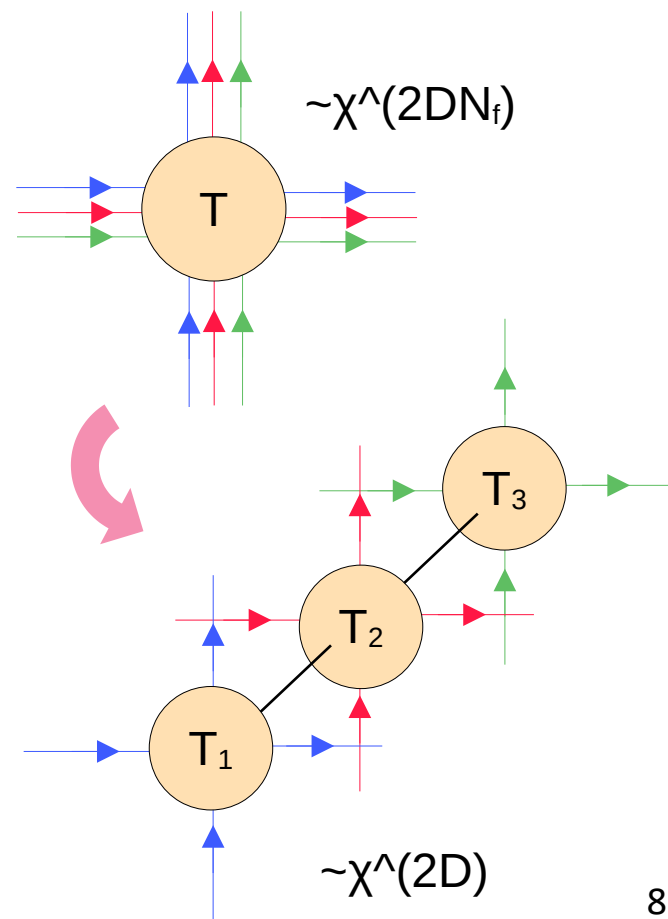
Based on [JHEP11(2023)187], with **Jun Nishimura** (KEK) and **Kouichi Okunishi** (Niigata U)

# Multi-flavor gauge theory

- The number of tensor legs increases with the number of flavors
- This makes it difficult to consider multi-flavor theory in the tensor network
- This can be avoided by separating flavor d.o.f. from each other

Similar ideas:

- Domain wall fermions (flavor = extra dim)
- MPO-like decomposition (Akiyama; 2023)





# Multi-flavor gauge theory

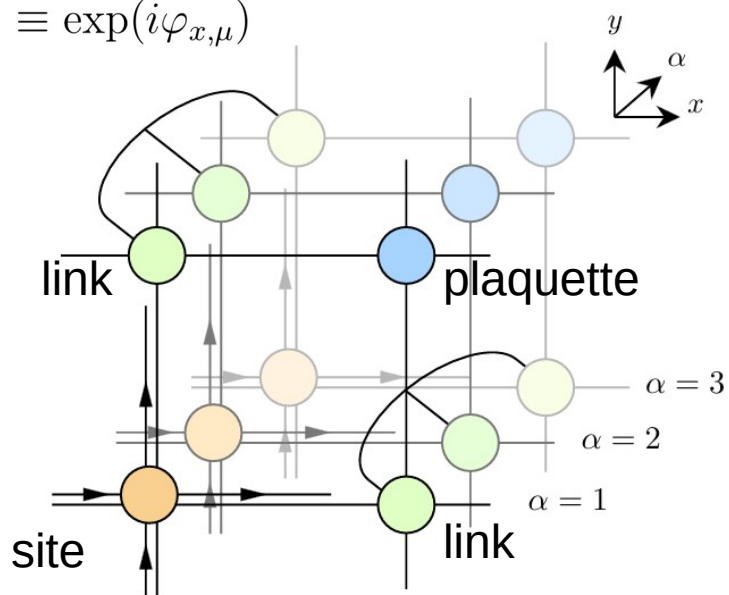
Separate the layers analytically

$$Z = \int D\varphi \prod_{\alpha=1}^{N_f} (D\varphi^{(\alpha)} D\psi^{(\alpha)} D\bar{\psi}^{(\alpha)}) \delta(\varphi^{(\alpha)} - \varphi) e^{-\sum_{\alpha} S^{(\alpha)}}$$

local action for each flavor

$$S^{(\alpha)} = \frac{1}{N_f} S_{\text{gauge}}[\varphi^{(\alpha)}] + \sum_{x \in \Lambda_2} \bar{\psi}_x^{(\alpha)} \mathcal{D}^{(\alpha)} \psi_x^{(\alpha)}$$

$$U_{x,\mu} = \exp(iaA_{x,\mu}) \equiv \exp(i\varphi_{x,\mu})$$



- each layer for each flavor
- connected via delta functions
- **Grassmann tensors** handle fermions directly

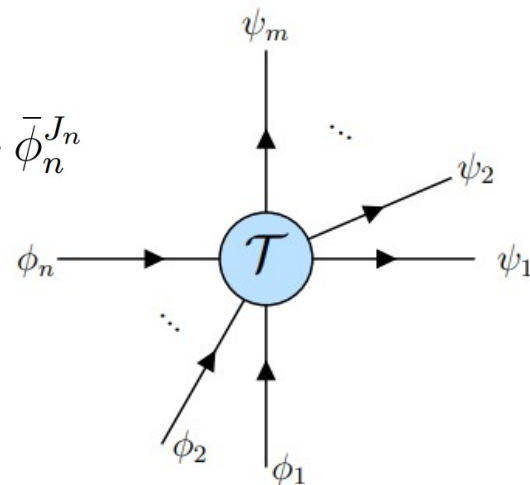
# Quick intro: Grassmann tensors

$$\mathcal{T}_{\psi_1 \dots \psi_m \bar{\phi}_1 \dots \bar{\phi}_n}$$

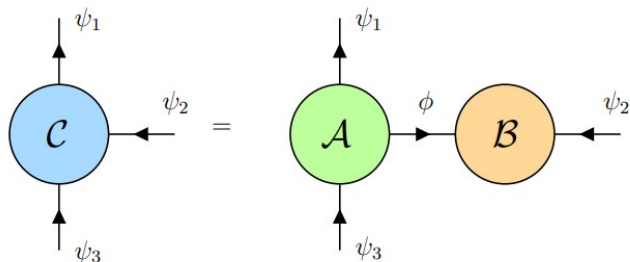
$$= \sum_{I_1, \dots, I_m, J_1, \dots, J_n} T_{I_1 \dots I_m J_1 \dots J_n} \psi_1^{I_1} \dots \psi_m^{I_m} \bar{\phi}_1^{J_1} \dots \bar{\phi}_n^{J_n}$$

Coefficient tensor

Multi-component Grassmann numbers



## Grassmann tensor contraction



$$C_{IJK} = \sum A_{ILK} B_{JLS} S_{JKL}$$

$$S_{JKL} = \sigma_L \times (-)^{p(L)(p(J)+p(K))+p(J)p(K)}$$

# GrassmannTN:

a python package for Grassmann TRG / DMRG

The screenshot shows the GitHub repository page for 'grassmanntn'. At the top, it is marked as 'Public' and has 6 stars and 0 forks. The repository is on the 'main' branch. The file list includes 'docs', 'LICENSE', 'README.md', '\_\_init\_\_.py', 'example.py', 'gauge2d.py', and 'param.py'. The 'About' section describes it as a Python package for Grassmann tensor network computation. The 'Releases' section shows version 1.2.3 as the latest release, published 3 weeks ago.

File	Commit Message	Time Ago
docs	Update the arxiv link	5 days ago
LICENSE	Initial commit	4 months ago
README.md	Update README.md	5 days ago
__init__.py	update gauge2d.trg with more o...	2 months ago
example.py	Update the quadrature function	3 weeks ago
gauge2d.py	Update the quadrature function	3 weeks ago
param.py	add trg function (incomplete) & ...	4 months ago

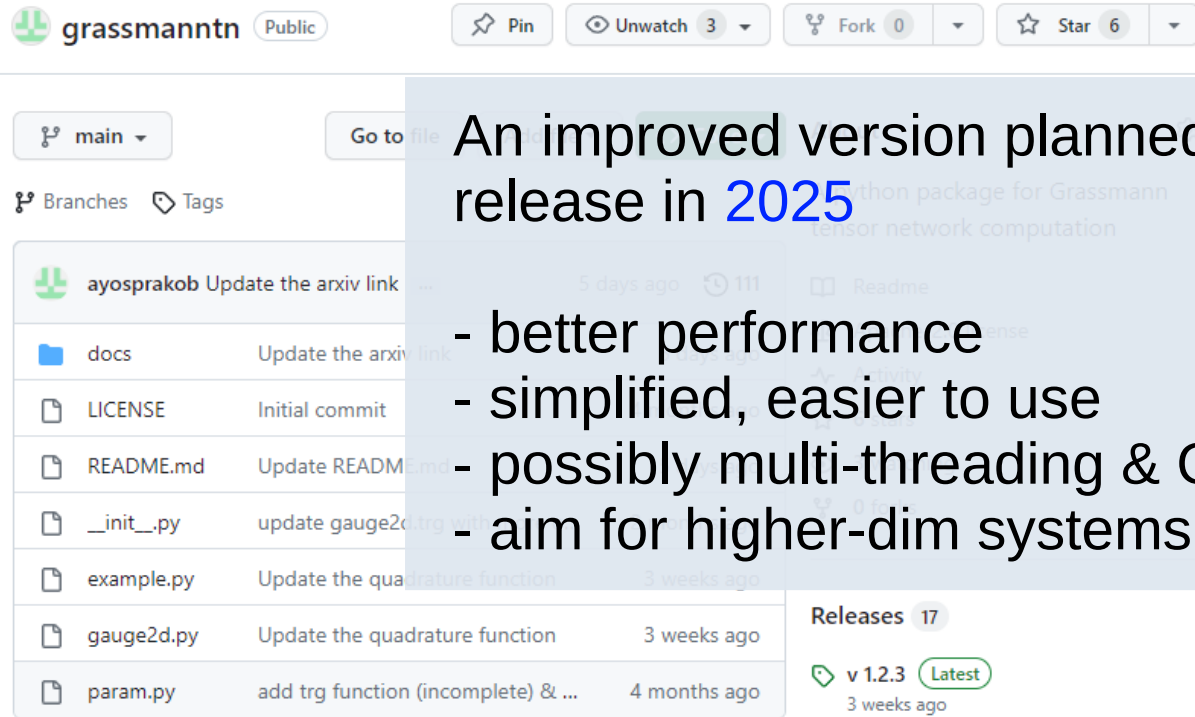
Features:  
Grassmann contractions,  
Tensor reshapes,  
SVD/EigVD,  
dense/sparse conversions,  
Grassmann arithmetic,  
Berezin integrals, etc.

complete tutorial for  
1+1D Schwinger model (TRG)

<https://github.com/ayosprakob/grassmanntn>

# GrassmannTN:

a python package for Grassmann TRG / DMRG



An improved version planned to release in 2025

- better performance
- simplified, easier to use
- possibly multi-threading & GPU
- aim for higher-dim systems

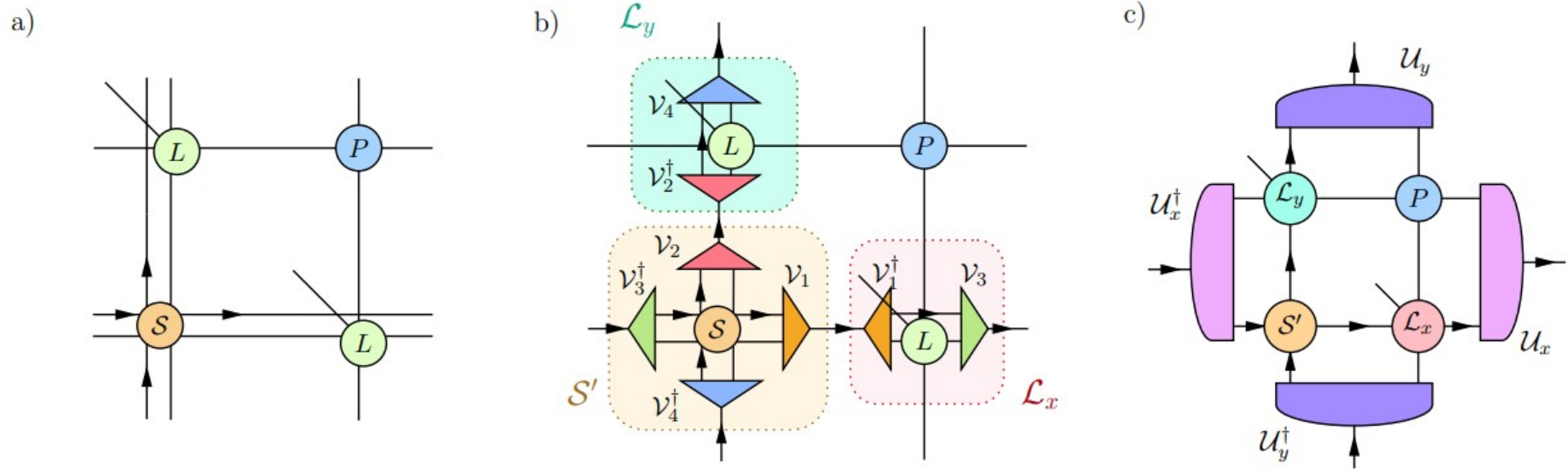
Features:

Grassmann contractions,  
Tensor reshapes,  
SVD/EigVD,  
dense/sparse conversions,  
Grassmann arithmetic,  
Berezin integrals, etc.

complete tutorial for  
1+1D Schwinger model (TRG)

# Tensor compression

Proposed compression scheme:



Isometries are first applied around the Grassmann tensor  $S$ : a  $\rightarrow$  b

Then another set is applied around the whole tensor: b  $\rightarrow$  c

# Compression performance

## Physical parameters

$\beta$	$\tilde{\mu}$	$N_f$	$K$	original size	compressed size	compression ratio	$D_x$	$D_y$
0.0	0.0	1	2	67108864	1024	$1.53 \times 10^{-5}$	4	4
0.0	0.0	1	3	3869835264	2304	$5.95 \times 10^{-7}$	4	4
0.0	0.0	1	4	68719476736	4096	$5.96 \times 10^{-8}$	4	4
0.0	0.0	1	5	640000000000	6400	$1.00 \times 10^{-9}$	4	4
2.0	0.0	1	2	67108864	16384	$2.44 \times 10^{-4}$	8	8
2.0	0.0	2	2	67108864	16384	$2.44 \times 10^{-4}$	8	8
2.0	3.0	1	2	67108864	16384	$2.44 \times 10^{-4}$	8	8
2.0	3.0	2	2	67108864	16384	$2.44 \times 10^{-4}$	8	8

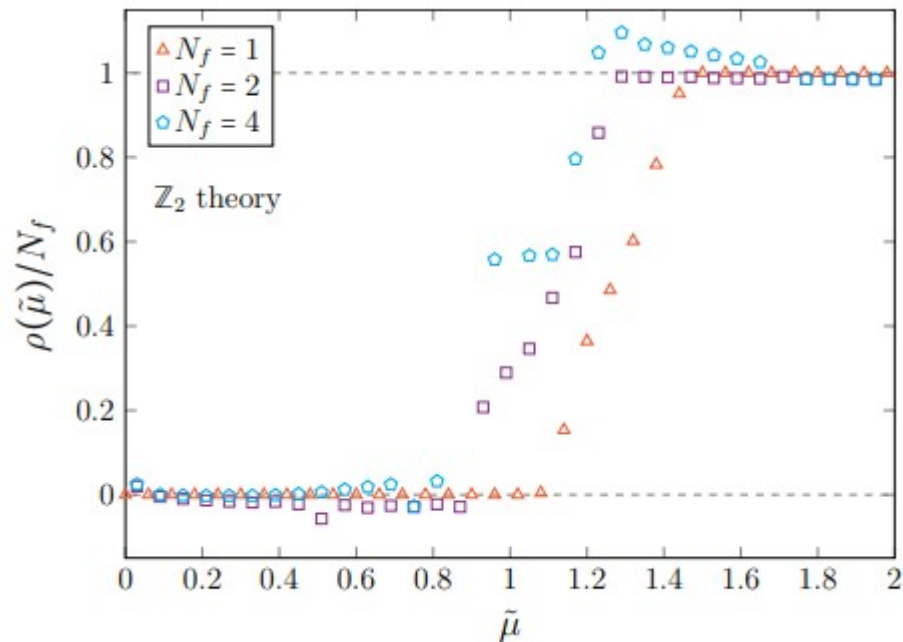
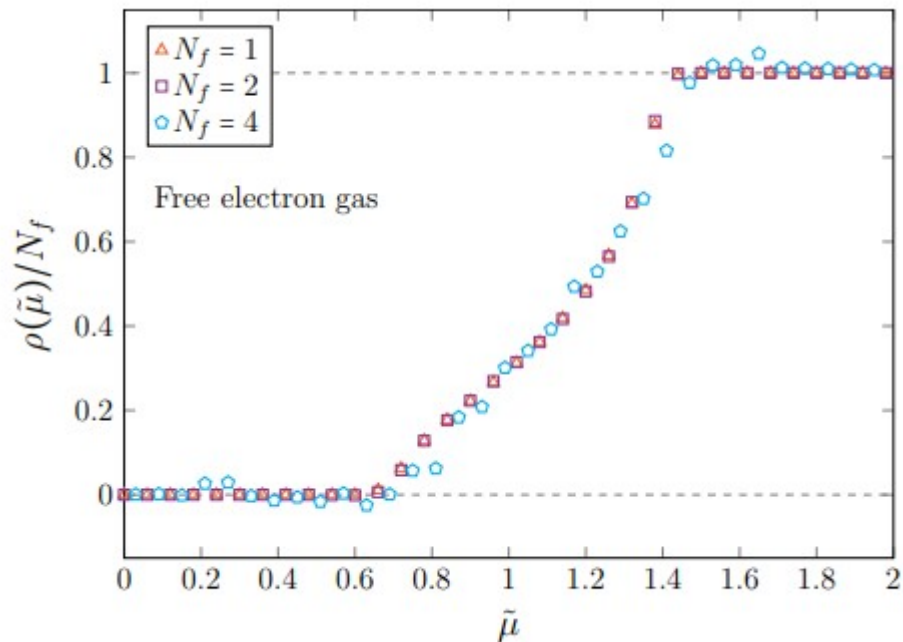
All of these compressions are **done without any spectrum truncation!**  
Such high performance is due to the sparse nature of fermions.

# Finite density and Silver Blaze

Flavors: HOTRG (Dcut=64, 32 for  $N_f=2, 4$ )

Space-time: Levin-Nave TRG (Dcut=64)

Silver Blaze is reproduced up to  $N_f=4$



This is typically difficult in Monte Carlo due to the **sign problem!**

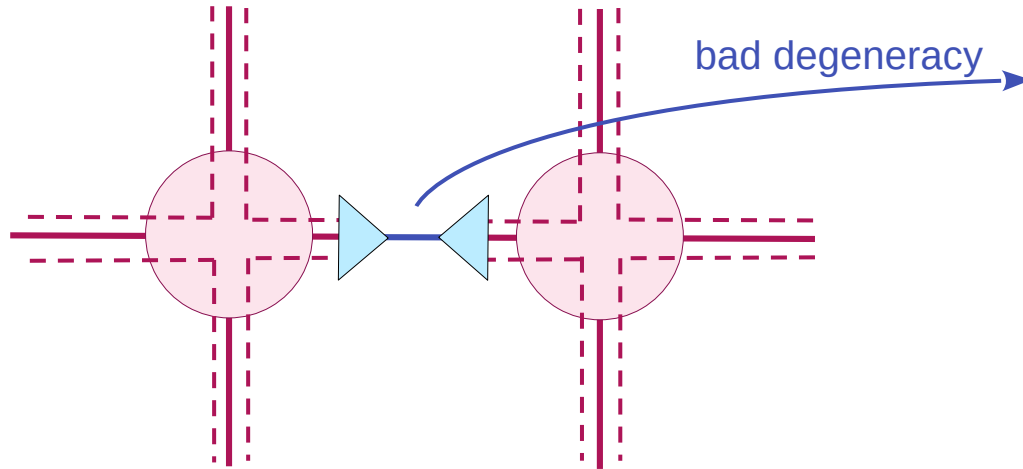
Part II:  
Armillary sphere  
Non-abelian gauge theory in higher dimensions

Based on [PTEP 2024 (2024) 7, 073B05] (Formulation)  
and [arXiv:2406.16763] (Numerical) with **Kouichi Okunishi** (Niigata U)

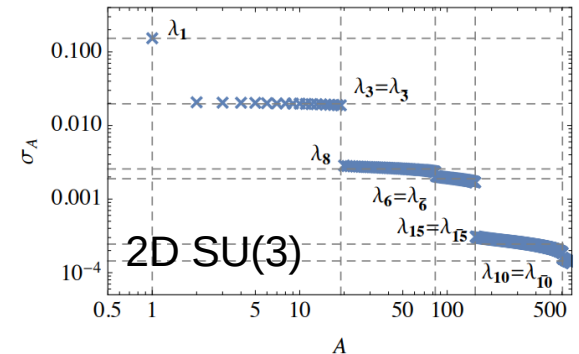
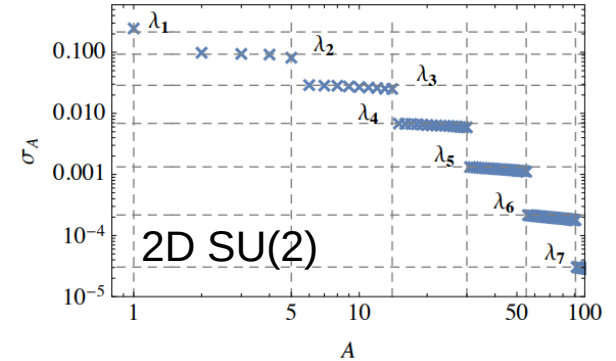


# Why is non-abelian tensor network difficult?

Internal symmetry in  $SU(N)$  is a redundancy in the tensor network that cannot be truncated by an SVD



The entanglement structure is nonlocal...



Figures from [Fukuma-Kadoh-Matsumoto; 2021]

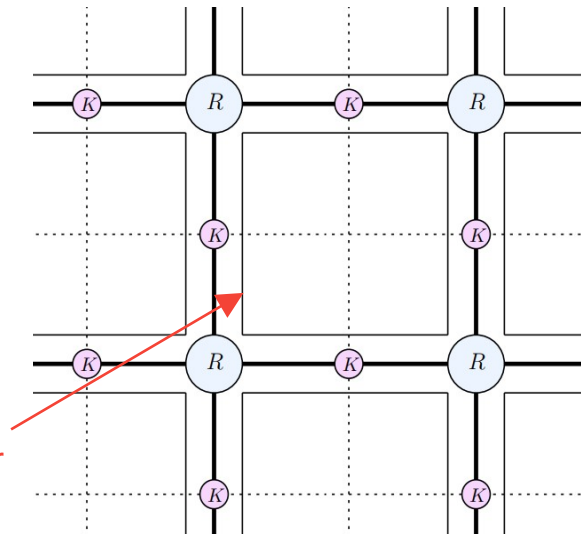
# Character expansion

---

- Lesson from 1+1D: the (matrix) index loops can be traced out if we use character expansion

[Hirasawa, Matsumoto, Nishimura, A.Y.; 2021]

- Degeneracy is completely eliminated

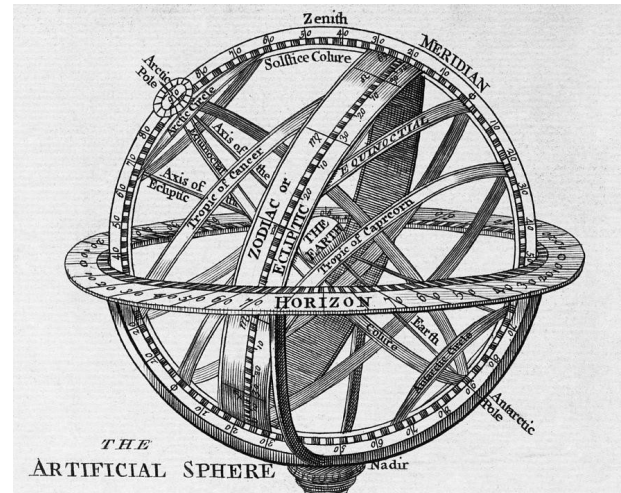
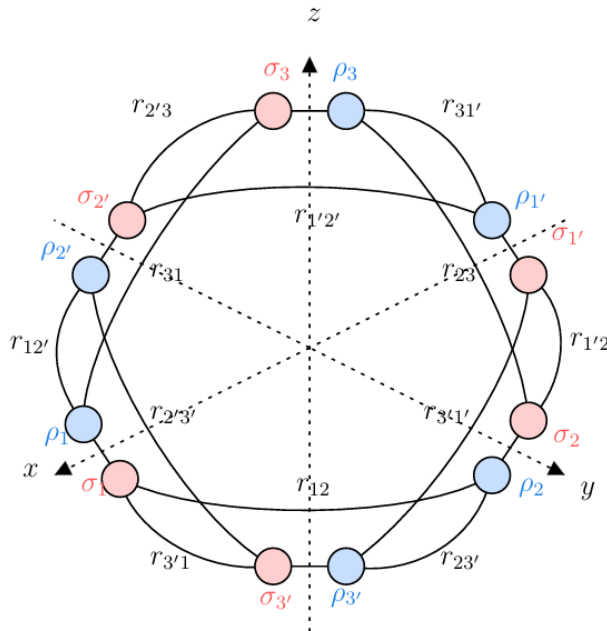


the source of singular value degeneracy

Can we do the same thing for any dimension?

# The armillary sphere

Yes! There is a similar closed network in any dimension  
Which we call **the armillary sphere**



**armillary sphere**  
**= intersecting circles**

This was first noticed by [Oeckl & Pfeiffer;2001] in the context of the [spin foam model](#).

# The armillary sphere

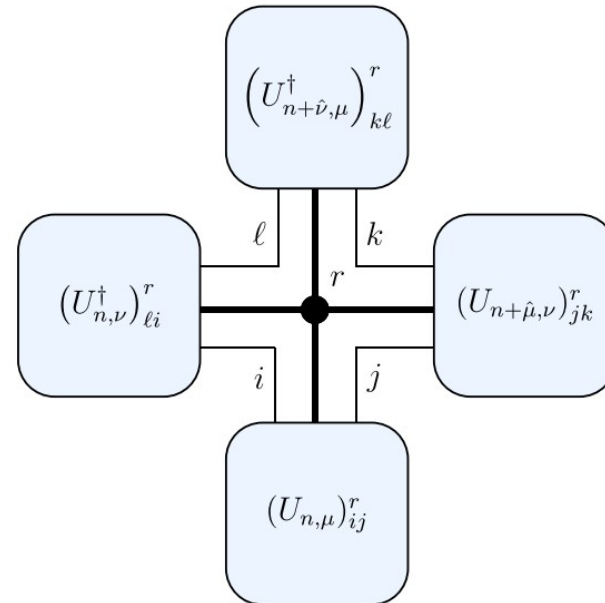
---

Step 1: perform character expansion on the Boltzmann weight

$$e^{\beta \mathfrak{H} \operatorname{tr} P_{n,\mu\nu}} = \sum_r f_r \operatorname{tr}_r (U_{n,\mu} U_{n+\hat{\mu},\nu} U_{n+\hat{\nu},\mu}^\dagger U_{n,\nu}^\dagger)$$

$$= \sum_r f_r \sum_{i,j,k,l} (U_{n,\mu})_{ij}^r (U_{n+\hat{\mu},\nu})_{jk}^r (U_{n+\hat{\nu},\mu}^\dagger)_{kl}^r (U_{n,\nu}^\dagger)_{li}^r$$

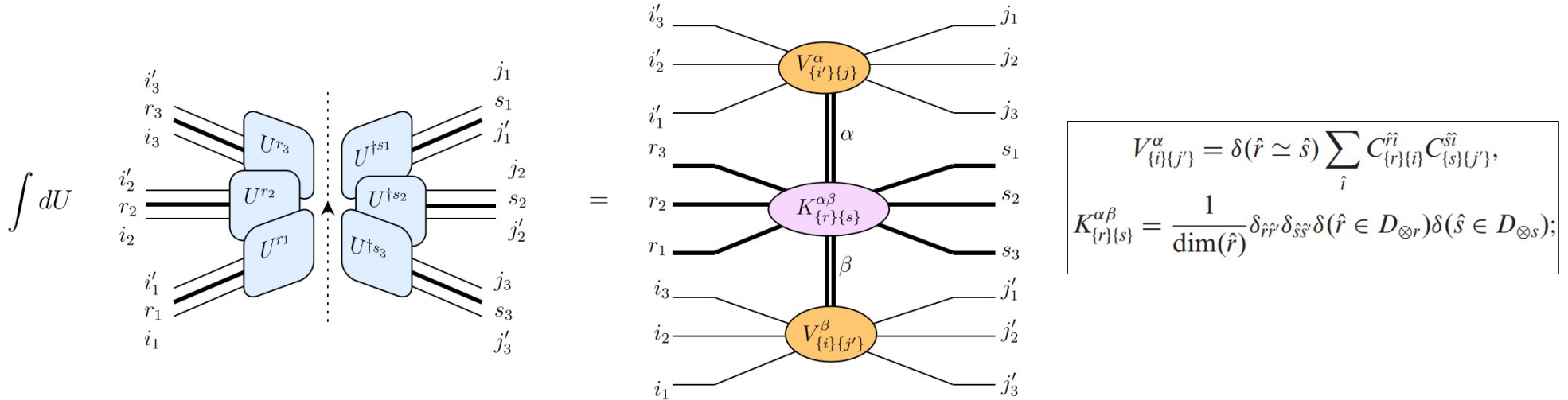
$$\operatorname{tr}_r P_{n,\mu\nu} =$$



# The armillary sphere

Step 2: perform group integral on each link variable

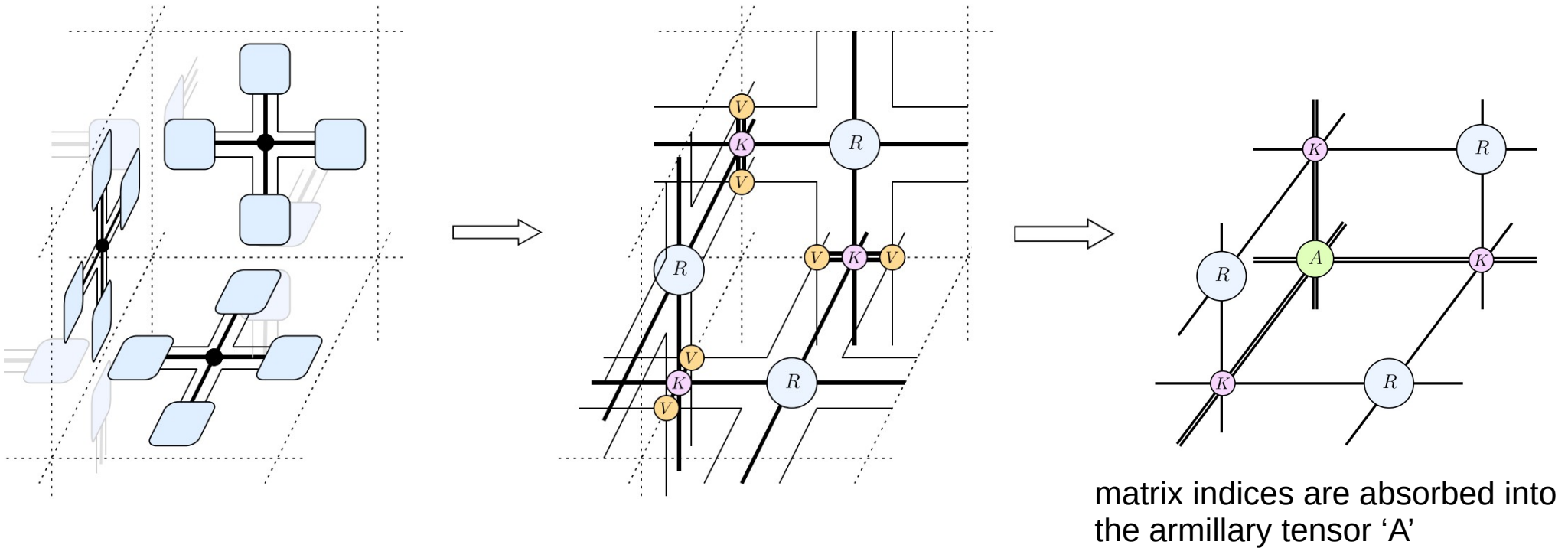
$$\int dU_{n,\mu} (U_{n,\mu})_{i_1 i'_1}^{r_1} \cdots (U_{n,\mu})_{i_{d-1} i'_{d-1}}^{r_{d-1}} (U_{n,\mu}^\dagger)_{j_1 j'_1}^{s_1} \cdots (U_{n,\mu}^\dagger)_{j_{d-1} j'_{d-1}}^{s_{d-1}} = \sum_{\hat{r} \in D_{\otimes r}} \sum_{\hat{s} \in D_{\otimes s}} \sum_{\hat{i}, \hat{j}} \frac{1}{\dim(\hat{r})} C_{\{r\}\{i\}}^{\hat{r}\hat{i}} C_{\{r\}\{i'\}}^{\hat{r}\hat{j}} C_{\{s\}\{j\}}^{\hat{s}\hat{j}} C_{\{s\}\{j'\}}^{\hat{s}\hat{i}} \delta(\hat{r} \simeq \hat{s})$$



Note: matrix indices (thin lines) are neatly separated into two layers

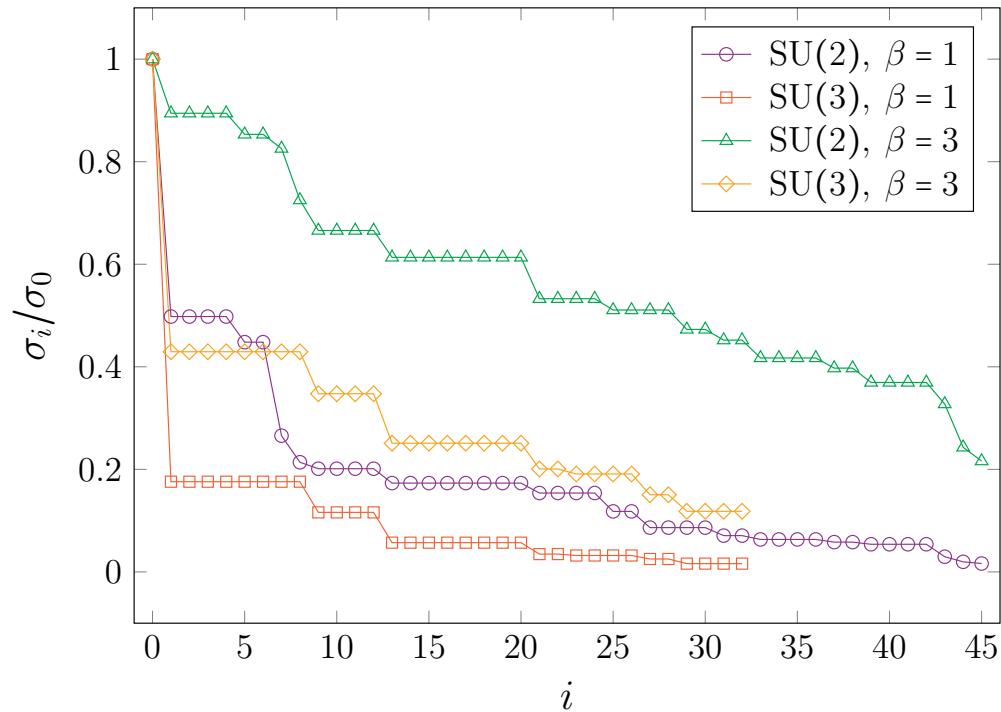
# The armillary sphere

## Step 3: Contract the matrix indices



# Result: singular value spectrum

---



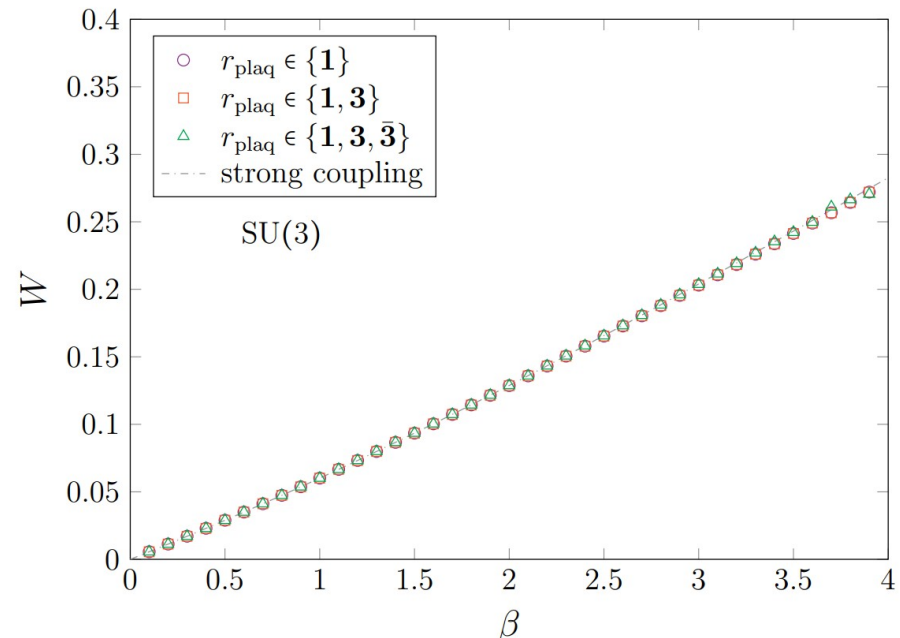
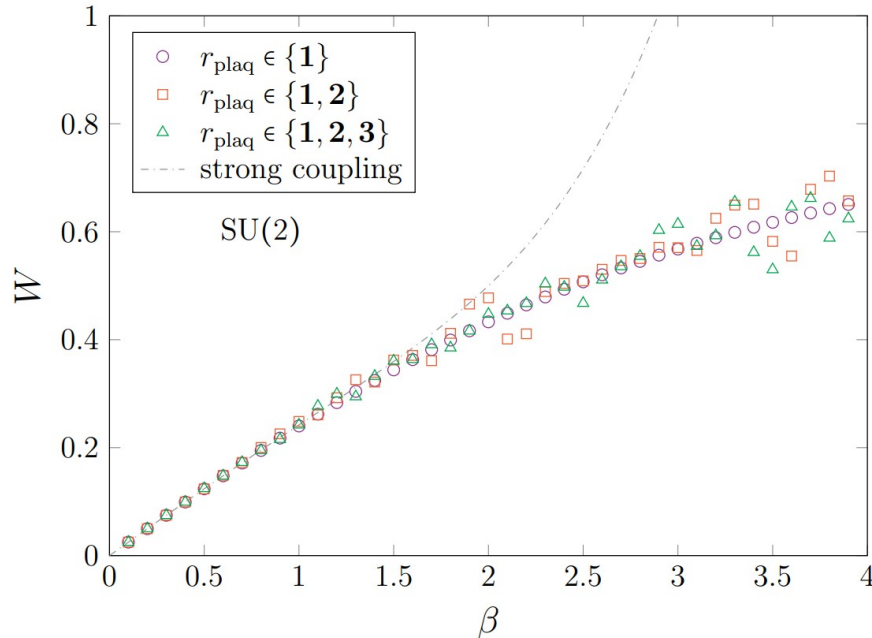
Singular value spectrum of the initial tensor do not have large degeneracy

# Result: average plaquette @ zero temperature

pure 2+1D SU(2) and SU(3) gauge theory

ATRG;  $V = 16^3$ ;  $D_{\text{cut}} = 16$

Average plaquette – consistent with strong coupling expansion

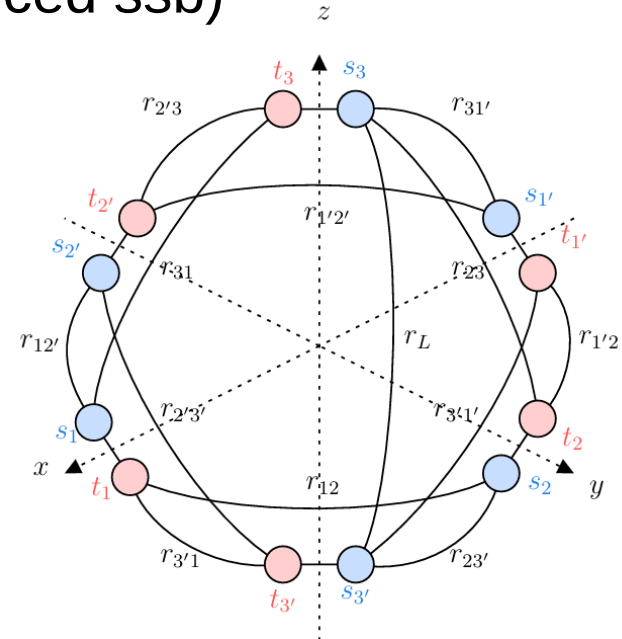
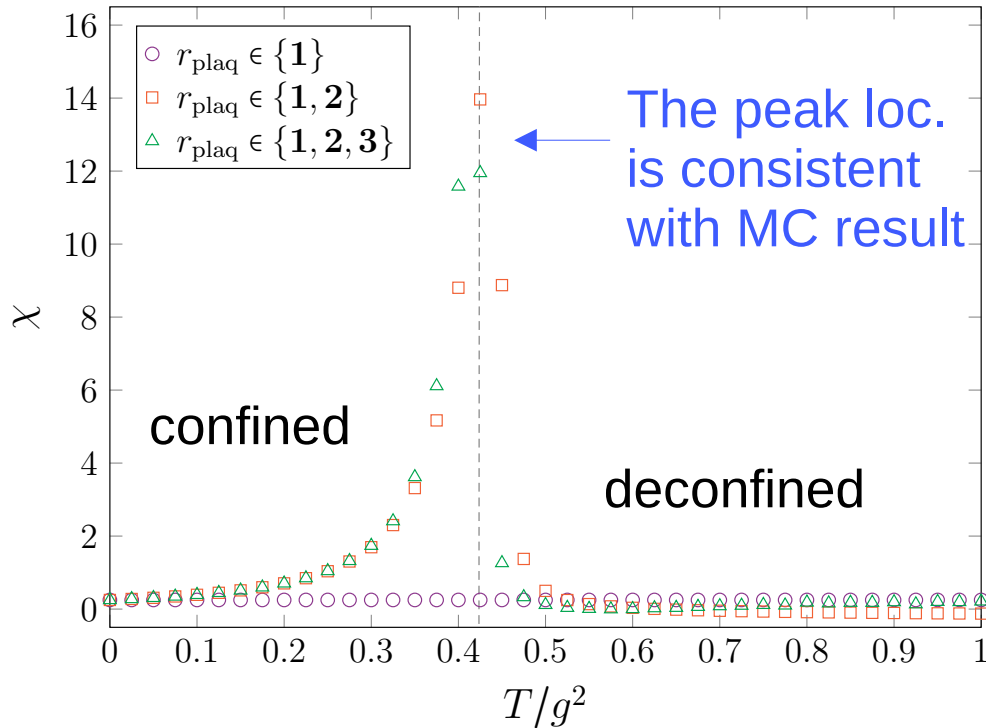




# Result: deconfinement @ finite temperature

TRG;  $V = 1 \times 1024^2$ ;  $D_{\text{cut}} = 64$

Polyakov loop susceptibility (with induced ssb)



Armillary sphere with polyakov loop

# Summary

---

- TRG is a promising methods for studying lattice theories
- We address 2 challenging aspects toward lattice QCD
  - Multiple fermion flavors can be handled with Grassmann Tensors with multi-layer construction
  - Degeneracy in non-abelian tensor network can be eliminated with the armillary sphere technique

# Future prospects

---

- Can we reduce the tensor network without character expansion? (Some variation of Gilt-TNR?) [Hauru, Delcamp, Mizera; 2017]
- Armillary sphere method with matter fields?
- More in-depth analysis (physical interpretation?)
- 4D gauge theory + theta term
- Etc.