

© European Tensor Network School, San Sebastian (2019)

An Introduction to **Symmetric** Tensor Networks

Sukhbinder Singh

Albert Einstein Institute, Potsdam

www.heptnseminar.org

(online seminar series on tensor networks)

GOALS:

- (i) What does the global symmetry imply for the **individual** tensors?
- (ii) How to **protect** & **exploit** the symmetry in numerical simulations?

(There are also **conceptual benefits** - classification of phases, holography etc.)

We will focus on symmetries described by groups

Restrict to compact and completely reducible groups

This includes most of the favourite groups in condensed matter

Finite groups: Z_n , $Z_2 \times Z_2$, the Pauli group $\{\sigma_x, \sigma_y, \sigma_z, I\}$

Continuous groups: $U(N)$, $SU(N)$, $SO(N)$

(Abelian and non-Abelian groups)

This talk: will use $SU(2)$ as an example

It illustrates most of the concepts required to implement symmetries

Irreps can be labelled systematically:

$$a, b, c, \dots$$

Each of these label a whole set of matrices.

Denote the **Irrep basis**:

$$|a, m_a\rangle$$

More general representations of the group can be obtained by combining irreps in two different ways

1) **Direct sum** (reducible representations): $a \oplus b$, $b \oplus c \oplus d \oplus b$, $a \oplus a$

basis:

$$|a, m_a, t_a\rangle$$

2) **Tensor product:** $a \otimes b$

A tensor product of irreps is **equivalent** to a direct sum representation

$$a \otimes b = x \oplus y \oplus z \oplus \dots$$

Fusion rules: Which irreps appear in the tensor product of any two irreps is completely determined by the group properties.

If irrep x appears in the tensor product of irreps a and b , we say that the three irreps (x, a, b) are **compatible**.

There exists a change of basis between the two representations:

$$|x, m_x\rangle = \sum_{m_a, m_b} C_{am_a, bm_b}^{xm_x} |a, m_a\rangle \otimes |b, m_b\rangle$$

"Coupled/Fusion basis" "Clebsch-Gordan coefficients"

The CG coefficients are **completely determined** by the group

(These coefficient are all equal to 1 for Abelian groups)

To summarize,

In the end we will need only the following data about the symmetry G

- 1) List of irreps (their labels/quantum numbers)
- 2) Fusion rules
- 3) Clebsch-Gordan coefficients

Representation Data of the symmetry

Outline

PART 1 (Conceptual)

- (1) Setup
- (2) Basic building blocks: **symmetric tensors**
- (3) Symmetric tensors are sparse! Example: $SU(2)$ symmetry

PART 2 (Practical)

- (1) Application I: $SU(2)$ TEBD algorithm
- (2) Application II: Using the symmetric MPS to detect gapped phases
(without using local or string order parameters)

GENERALIZATIONS

Setup

Lattice

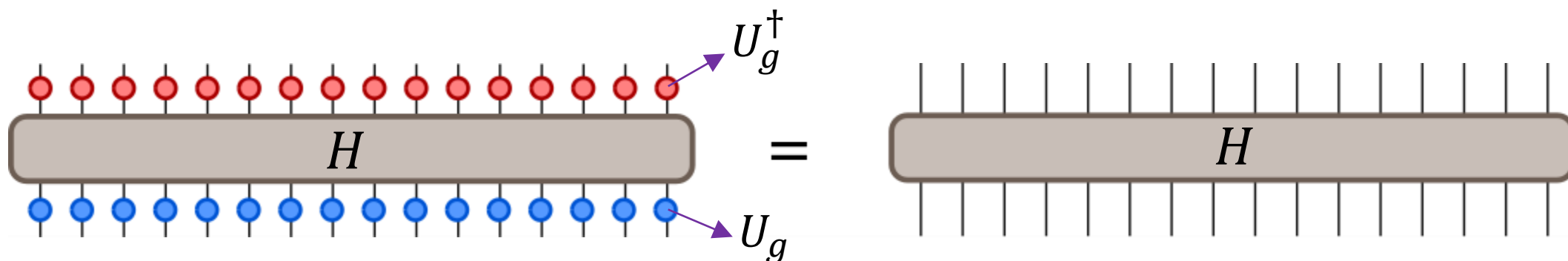


Global action of a symmetry

$U_g \quad U_g \quad U_g \quad U_g \quad U_g \quad U_g \quad U_g \quad U_g$

Local Hamiltonian

$$[H, U_g] = 0 \text{ for all } g$$



Ground state

$$|\Psi\rangle = U_g |\Psi\rangle \text{ for all } g$$

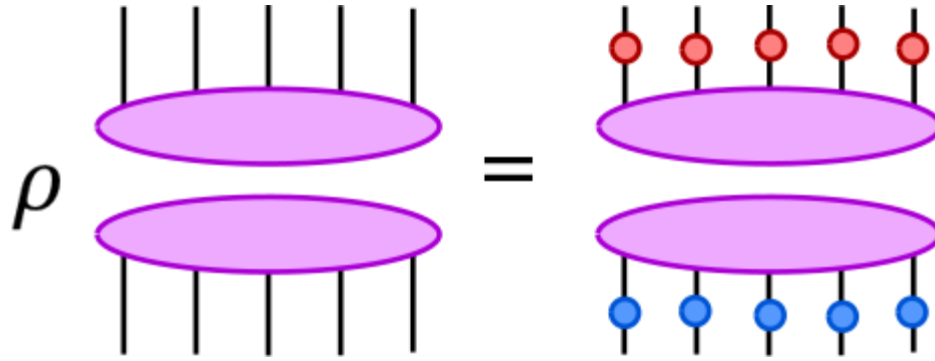
$|\Psi\rangle$



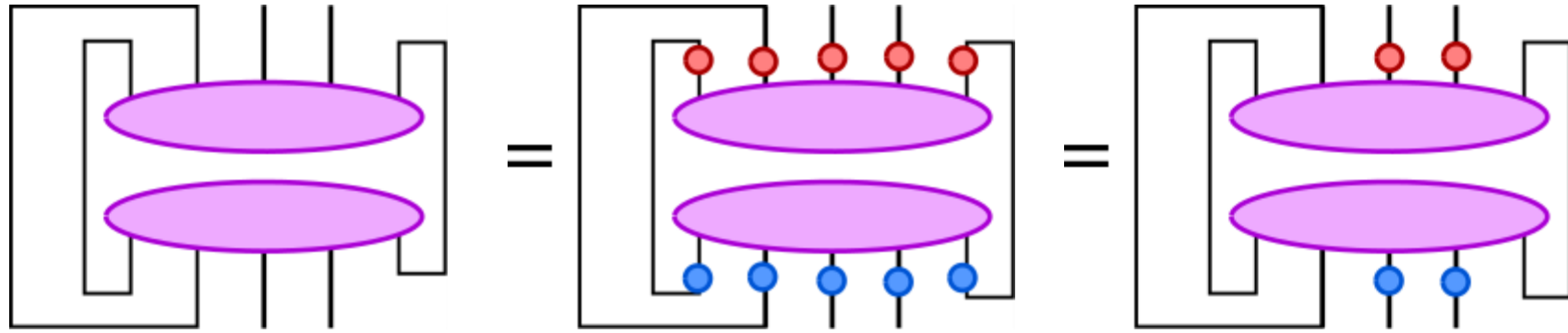
Density matrix of any subset of sites also commutes with the symmetry



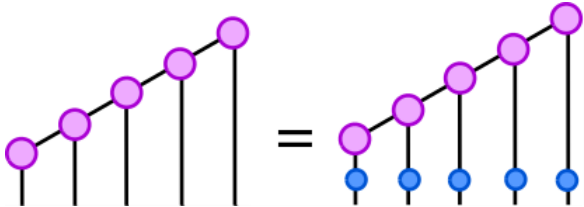
Density matrix of any subset of sites also commutes with the symmetry



Density matrix of any subset of sites also commutes with the symmetry

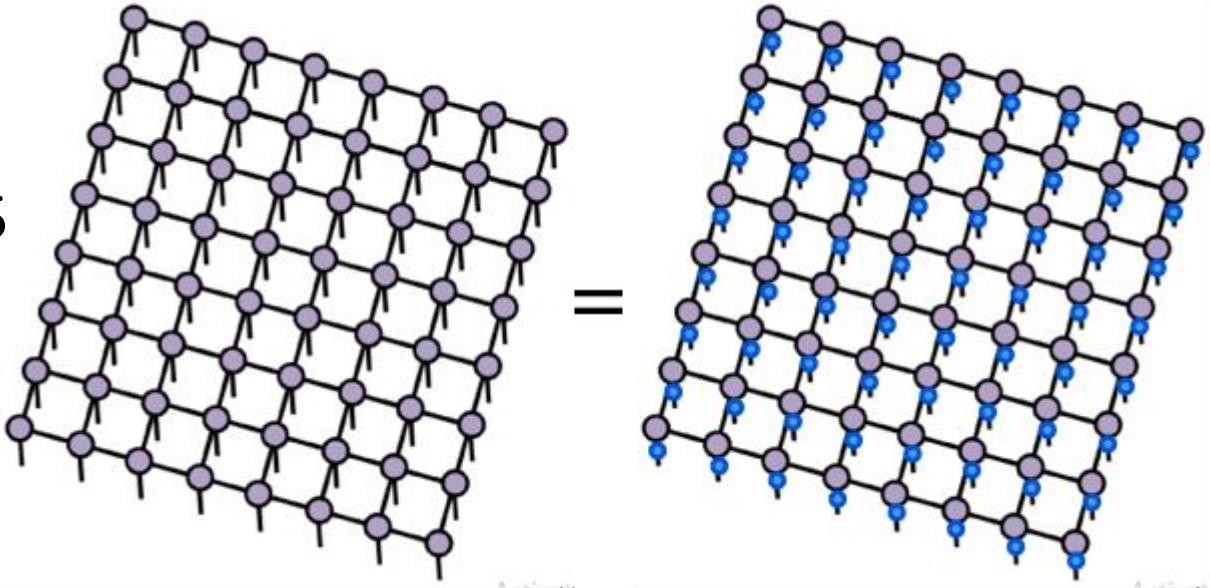


$|\Psi\rangle$ is described by a tensor network

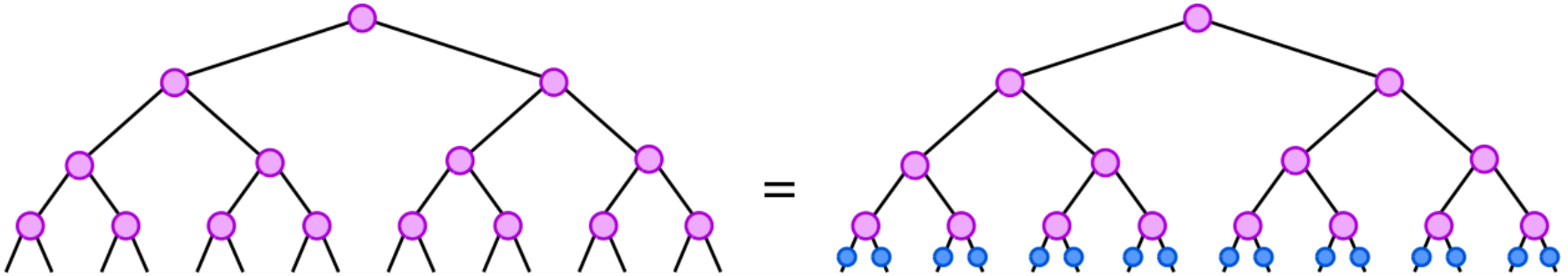


MPS

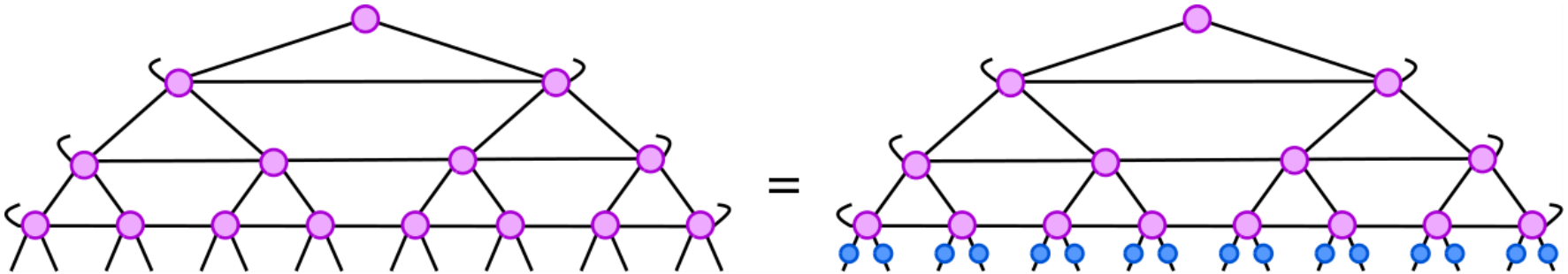
PEPS



TTN



MERA



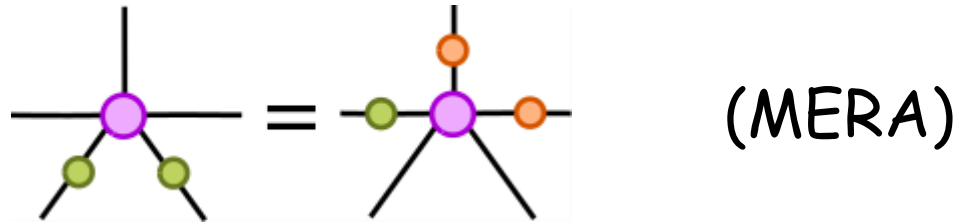
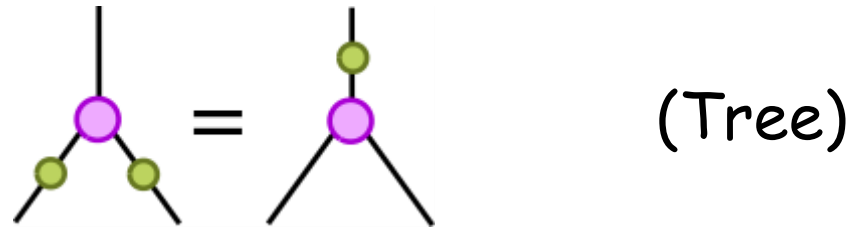
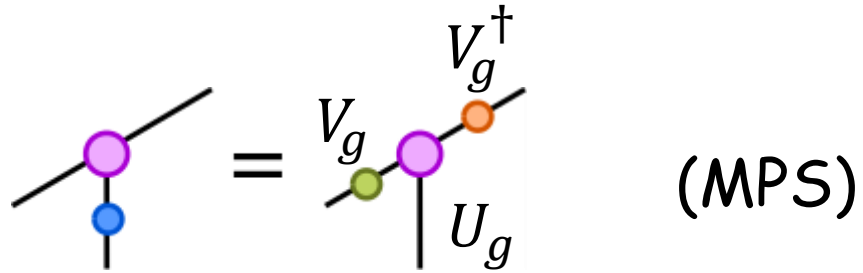
$\forall g$

GOALS:

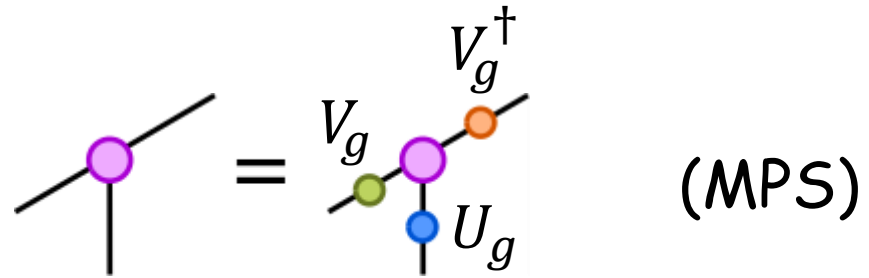
- (i) What does the global symmetry imply for the **individual** tensors?
- (ii) How to **protect** & **exploit** the symmetry in numerical simulations?

Symmetric tensors as building blocks

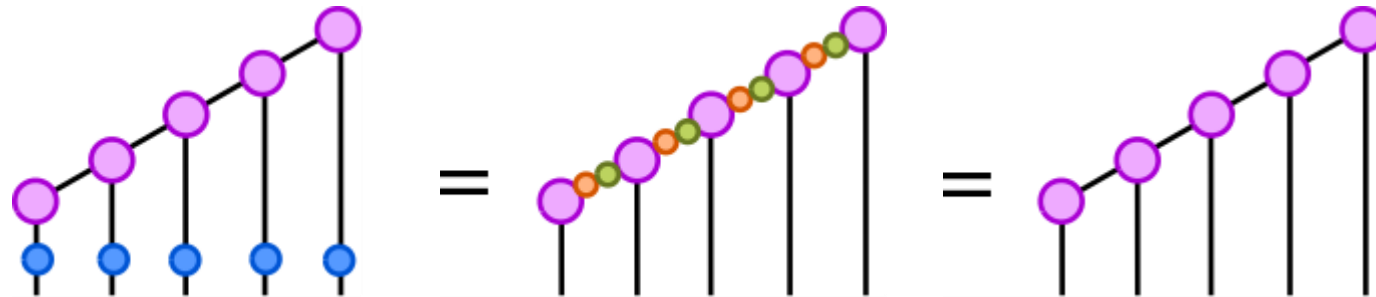
Suppose that the individual tensors are **symmetric**



A tensor network made of symmetric tensors has a global symmetry

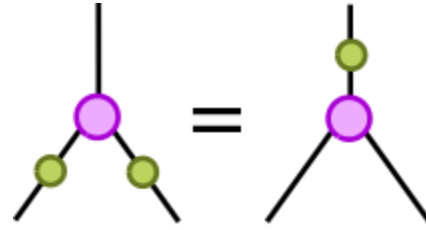


The diagram shows a single pink circular tensor with two legs: one diagonal leg pointing up and to the right, and one vertical leg pointing down. This is set equal to a more complex structure. On the right side of the equals sign, there is a pink circular tensor with three legs: a diagonal leg pointing up and to the right, a vertical leg pointing down, and a diagonal leg pointing up and to the left. The vertical leg is connected to a blue circular tensor labeled U_g . The diagonal leg pointing up and to the left is connected to a green circular tensor labeled V_g . The diagonal leg pointing up and to the right is connected to an orange circular tensor labeled V_g^\dagger . To the right of this entire expression is the text "(MPS)".

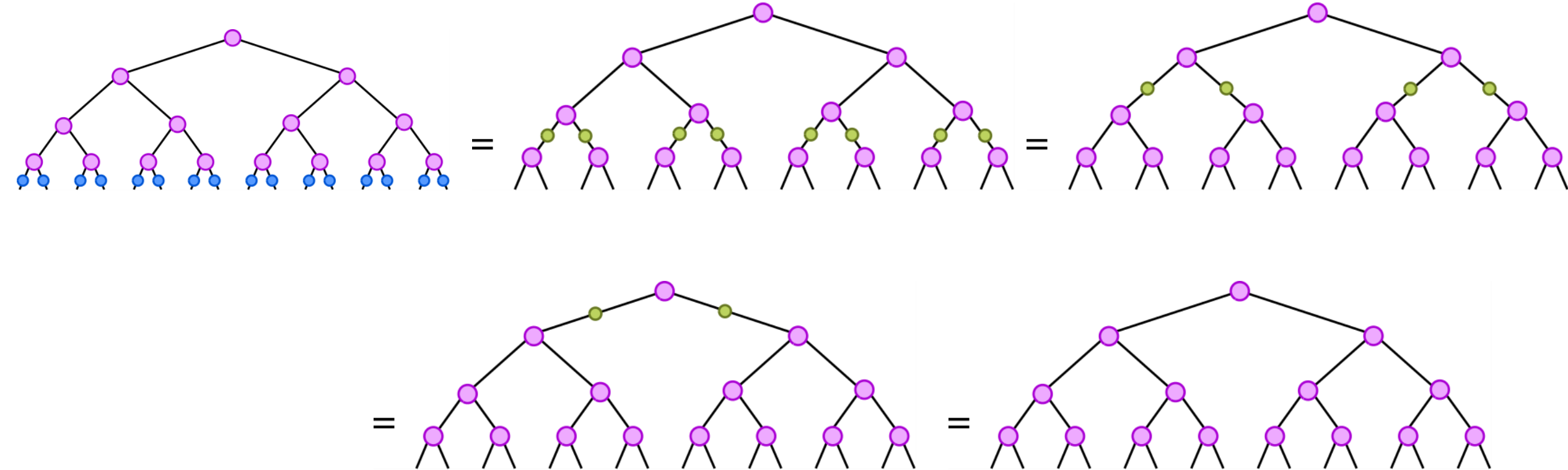


The diagram shows a sequence of three tensor networks connected by equals signs. The first tensor network consists of a chain of five pink circular tensors connected diagonally. Each pink tensor has a vertical leg pointing down, which is connected to a blue circular tensor. The second tensor network is identical to the first, but the first three vertical legs (and their corresponding blue tensors) are now connected to a chain of three green circular tensors labeled V_g , which are in turn connected to a chain of three orange circular tensors labeled V_g^\dagger . The third tensor network is identical to the first, showing the result of contracting the V_g and V_g^\dagger tensors into a single identity line.

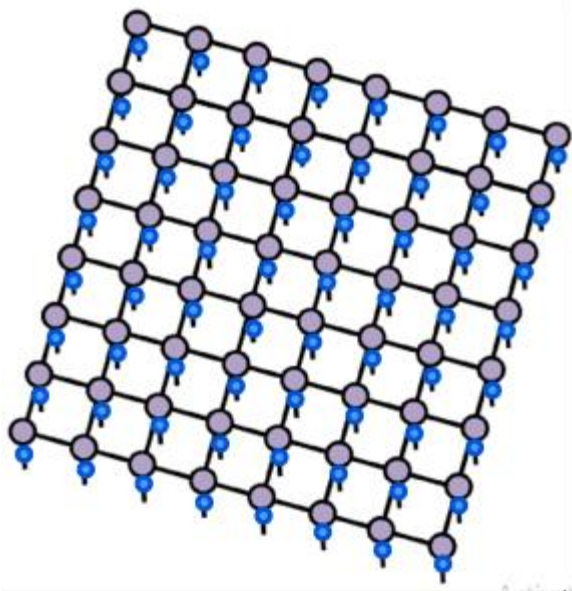
A tensor network made of symmetric tensors has a global symmetry



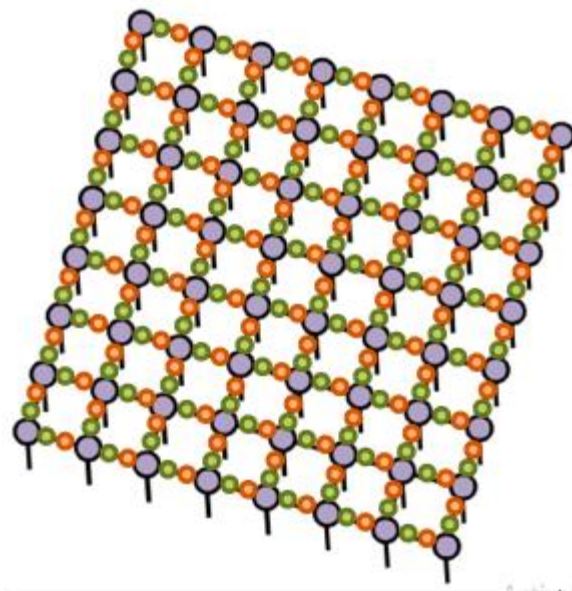
(Tree)



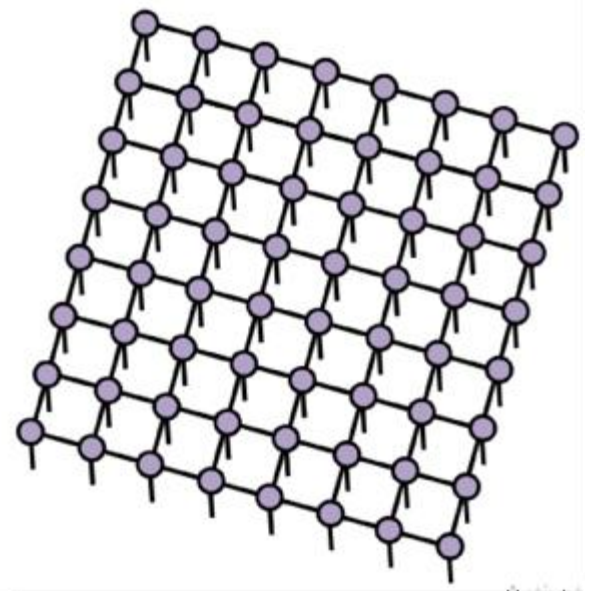
A tensor network made of symmetric tensors has a global symmetry



=



=



So

symmetric tensors \Rightarrow global symmetry

But is the *reverse* true?

A useful fact

$$M \begin{array}{|c} \text{---} \\ \text{---} \end{array} = M \begin{array}{|c} \text{---} \text{---} \text{---} \\ \text{---} \text{---} \text{---} \end{array}$$

A symmetric matrix can always be eigenvalue decomposed as a product of symmetric matrices

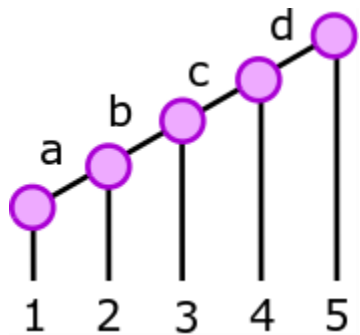
$$M \begin{array}{|c} \text{---} \\ \text{---} \end{array} = \begin{array}{|c} \text{---} \\ \text{---} \\ \text{---} \end{array} \begin{array}{|c} \text{---} \\ \text{---} \\ \text{---} \end{array}$$

$$Q \begin{array}{|c} \text{---} \\ \text{---} \end{array} = Q \begin{array}{|c} \text{---} \text{---} \text{---} \\ \text{---} \text{---} \text{---} \end{array} V_g$$

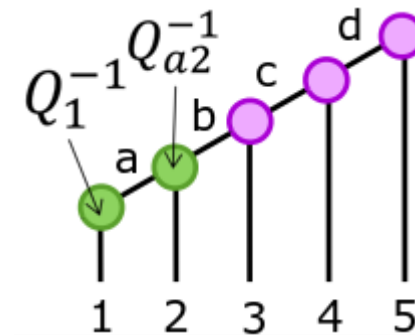
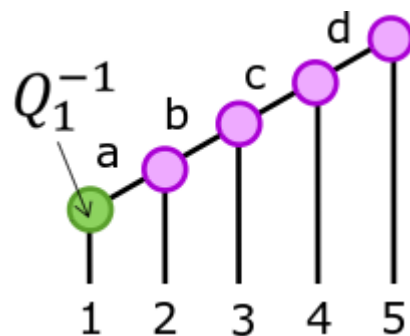
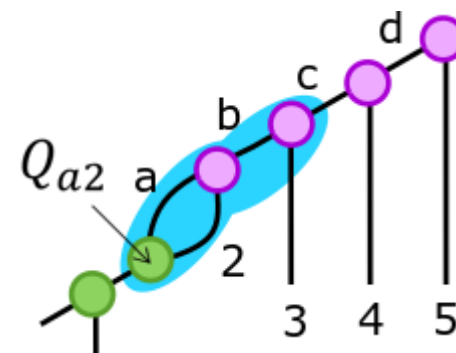
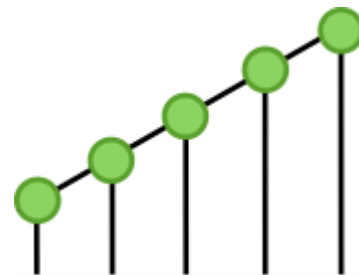
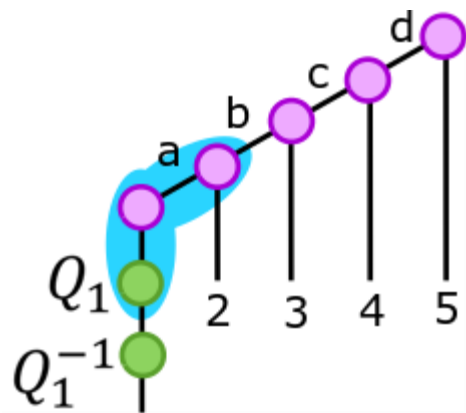
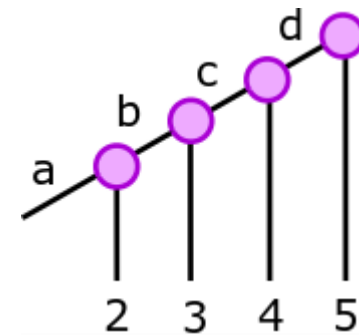
$$D \begin{array}{|c} \text{---} \\ \text{---} \end{array} = D \begin{array}{|c} \text{---} \text{---} \text{---} \\ \text{---} \text{---} \text{---} \end{array} V_g^\dagger$$

V_g : Some representation of the group

Matrix Product States (OBC)



$$\rho_1 \text{ (pink circle)} = \begin{array}{c} \text{green circle } Q_1 \\ \text{green circle } D_1 \\ \text{green circle } Q_1^{-1} \end{array} \quad \rho_{a2} \text{ (green circle)} = \begin{array}{c} \text{green circle } Q_{a2} \\ \text{green circle } D_{a2} \\ \text{green circle } \end{array}$$

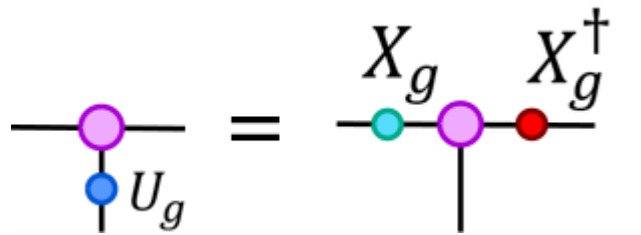


Matrix Product States (PBC & translation-invariance)

Previous proof does not work because of loops

But can use the fundamental theorem of MPS (more general proof. Covers the OBC case too)

Assume MPS is in a canonical form (ref. David's talk)



X_g : Some representation of the group

Can be projective!

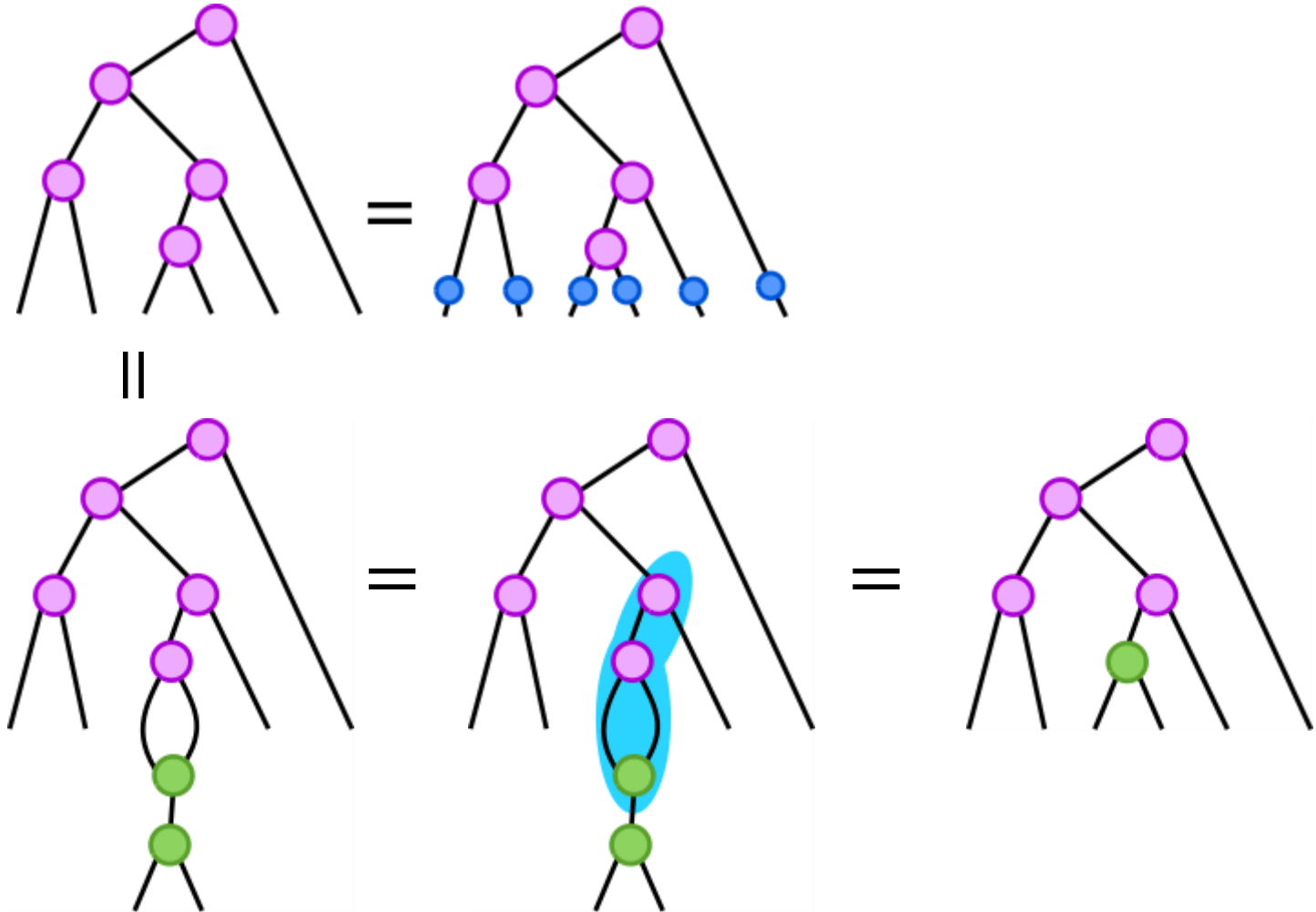
X_g is unitary, if MPS is in the canonical form

Thus, for the MPS (with OBC or PBC)

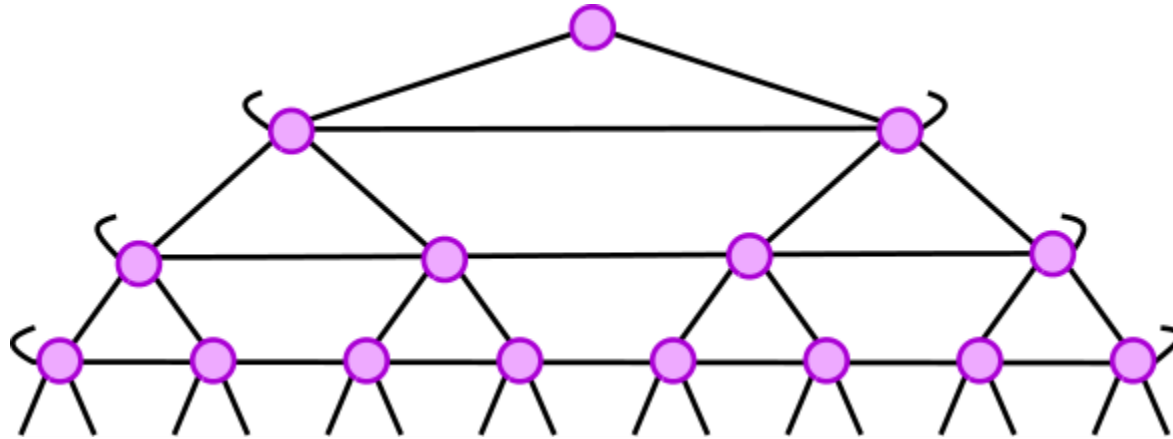
global symmetry \Rightarrow symmetric tensors

Tree tensor network states

The same proof technique from MPS with OBC works
(MPS with OBC is simply a special case of trees)

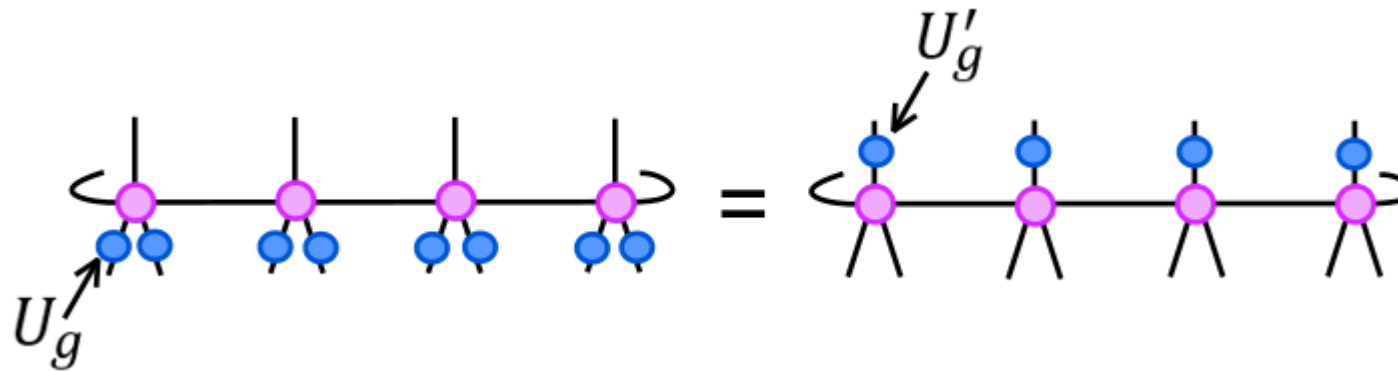


MERA

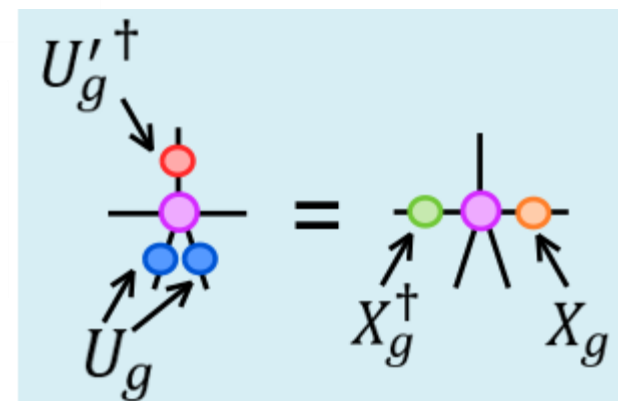
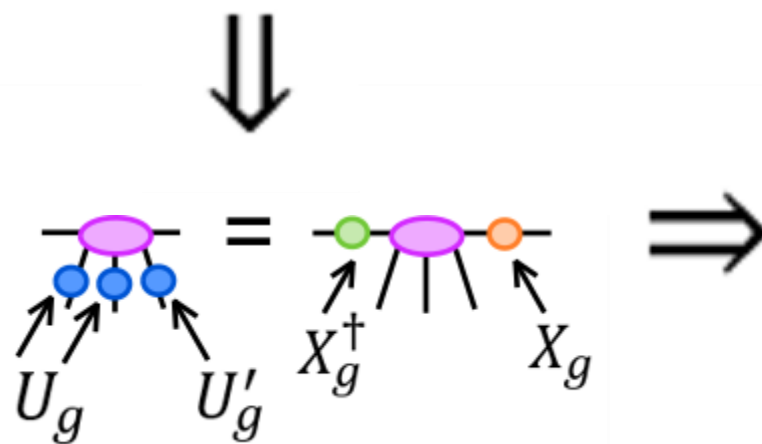
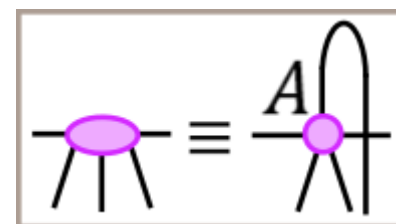
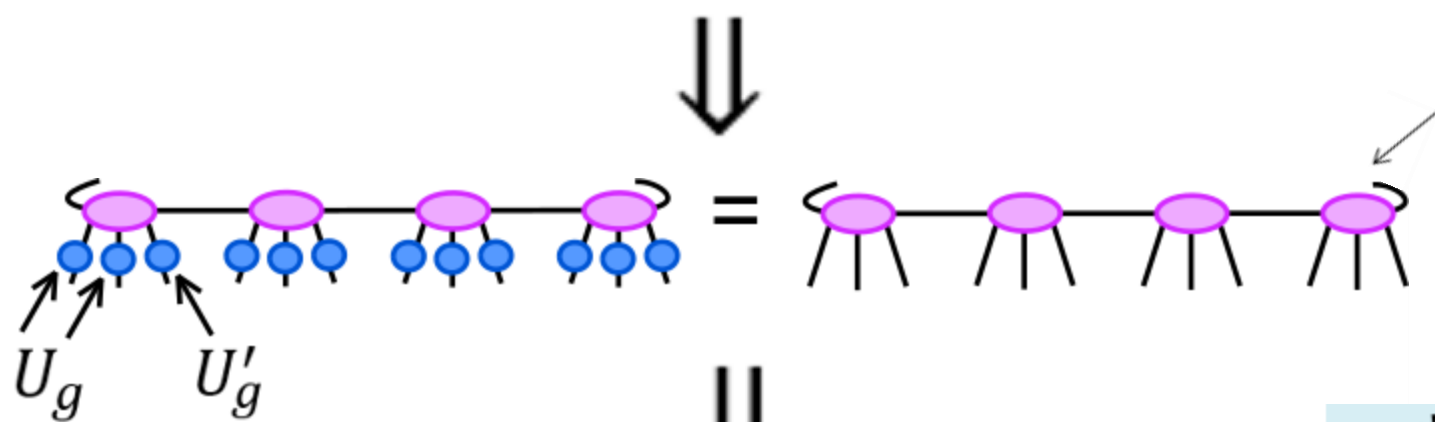
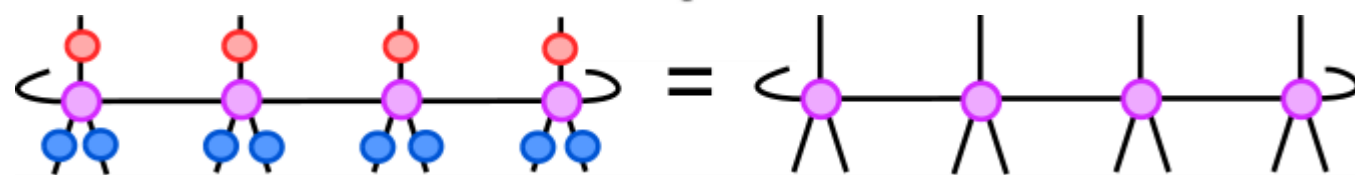
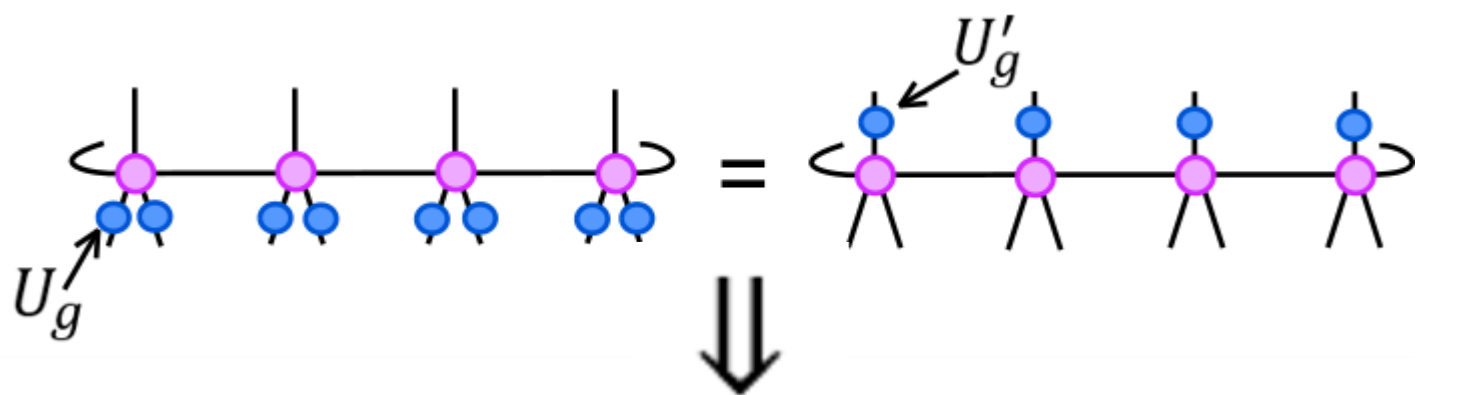


Can't say much very generally.

But we can prove symmetric tensors if we assume the following:



(Heuristic motivation: anomaly matching condition of RG in QFT)



Symmetric tensors are sparse

Representation data of SU(2)

Irrep labels: $0, \frac{1}{2}, 1, \frac{3}{2}, \dots$ (possible values of total spin)

Irrep basis: $|j, m_j\rangle$ (diagonalizes generator Z of SU(2))

 the spin projection along z-axis (takes values: $-j, -j + 1, \dots, j$)

Dimension of irrep j : $2j+1$ e.g. $\dim(0) = 1$, $\dim(1/2) = 2$, $\dim(1) = 3$

Example: For total spin $\frac{1}{2}$ the basis consists of 2 states:

$$|j = \frac{1}{2}, m = -\frac{1}{2}\rangle$$

$$|j = \frac{1}{2}, m = \frac{1}{2}\rangle$$

Example: For spin 1 the basis consists of 3 states:

$$|j = 1, m = -1\rangle$$

$$|j = 1, m = 0\rangle$$

$$|j = 1, m = 1\rangle$$

Representation data of $SU(2)$

Direct sum of irreps.

Examples: (i) $0 \oplus 1$, (ii) $0 \oplus 0 \oplus 1 \oplus 1 \oplus 1$, (iii) $1 \oplus \frac{1}{2}$

Basis. (i) $|j=0, m_0=0\rangle, |j=1, m_1=-1\rangle, |j=1, m_1=0\rangle, |j=1, m_1=1\rangle$
(ii) $|j=0, m_0=0, t_0=1\rangle, |j=0, m_0=0, t_0=2\rangle, \dots$

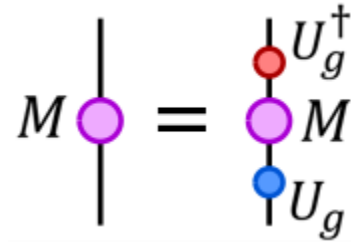
Fusion rules

Examples: $0 \otimes j = j \otimes 0 = j$ $\frac{1}{2} \otimes \frac{1}{2} = 0 \oplus 1$ $\frac{1}{2} \otimes 1 = \frac{1}{2} \oplus \frac{3}{2}$

Generally,

$$a \otimes b = |a-b| \oplus \dots \oplus a+b$$

SU(2)-symmetric matrix


$$M \text{ (on a line)} = U_g^\dagger \text{ (red dot)} \text{ } M \text{ (purple dot)} \text{ } U_g \text{ (blue dot)}$$

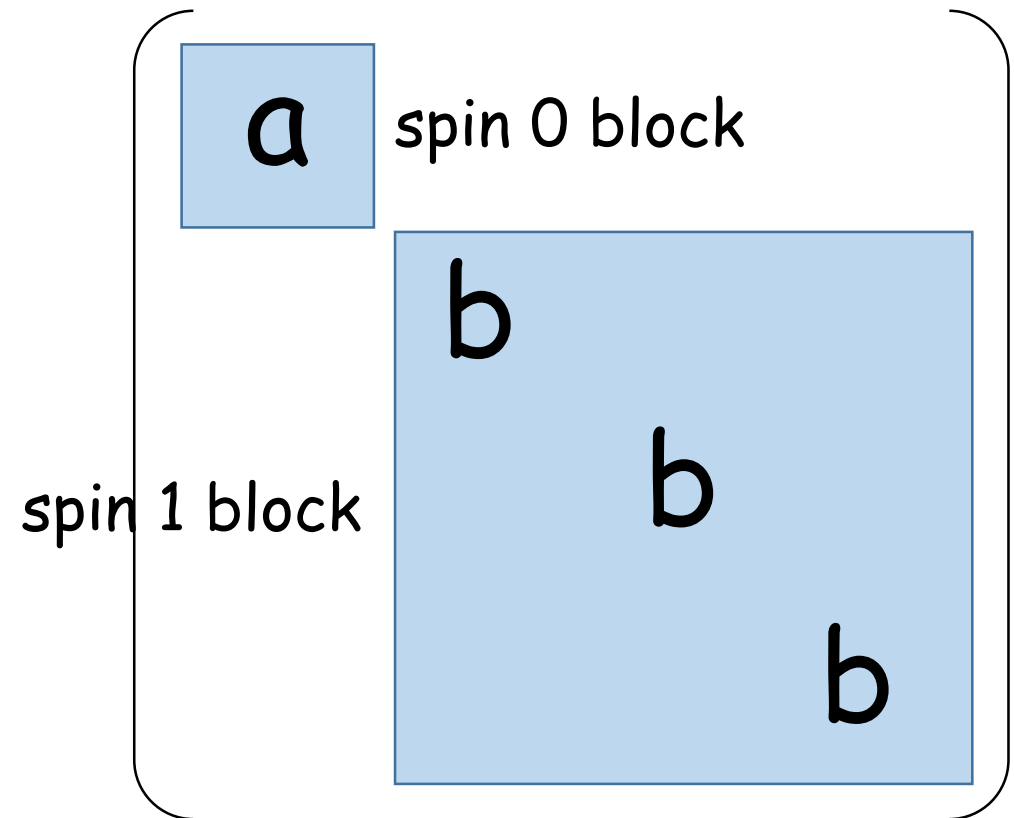
1) If U_g is an irrep then M is proportional to the Identity (**Schur's Lemma**).

2) If U_g is a direct sum of irreps

Example: $U_g = 0 \oplus 1$

Total dimension of $M = 4 \times 4$

Number of free parameters = 2



SU(2)-symmetric matrix

"Degeneracy matrix"

3) If U_g is a sum of degenerate irreps

$$M \text{ (purple circle)} = \begin{array}{c} \text{red circle } U_g^\dagger \\ \text{purple circle } M \\ \text{blue circle } U_g \end{array} \Rightarrow M = \bigoplus_j (X_j \otimes I_j)$$

$$M \text{ (purple circle)} = \bigoplus_j \begin{array}{c} X_j \text{ (arrow to orange circle)} \\ \text{orange circle} \\ I_j \end{array}$$

Example: $U_g = 0 \oplus 0 \oplus 1 \oplus 1 \oplus 1$

Total dimension of $M = 11 \times 11$

Total dimension of $X_0 = 2 \times 2$

Total dimension of $X_1 = 3 \times 3$

Total number of free parameters $4 + 9 = 13$

$$M = (X_0 \otimes I_0) \oplus (X_1 \otimes I_1)$$

SU(2)-symmetric vector

$$\begin{array}{c} \text{purple circle} \\ | \end{array} = \begin{array}{c} \text{purple circle} \\ | \\ \text{blue circle} \end{array} U_g \Rightarrow \begin{array}{c} \text{orange circle} \\ | \end{array} j = 0, t_0$$

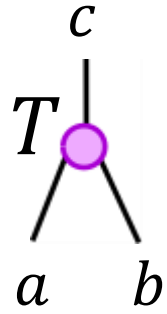
Example: $U_g = 0 \oplus 0 \oplus 1 \oplus 2$

Total dimension of $U_g = 1 + 1 + 3 + 5 = 10$

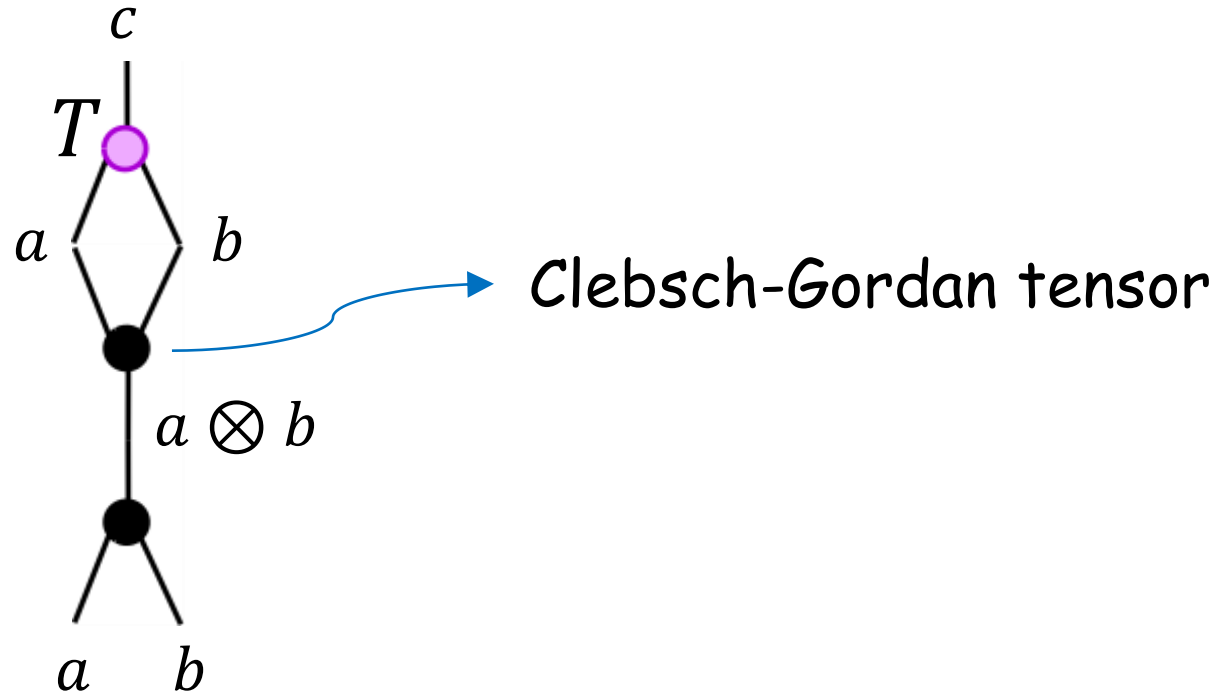
Dimension of spin 0 subspace = $1 + 1 = 2$

$$\begin{pmatrix} \sqrt{\frac{1}{4}} \\ \sqrt{\frac{3}{4}} \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \end{pmatrix} \begin{array}{l} \left. \vphantom{\begin{pmatrix} \sqrt{\frac{1}{4}} \\ \sqrt{\frac{3}{4}} \end{pmatrix}} \right\} j = 0 \\ \left. \vphantom{\begin{pmatrix} 0 \\ 0 \\ 0 \\ 0 \\ 0 \end{pmatrix}} \right\} 1 \oplus 2 \end{array}$$

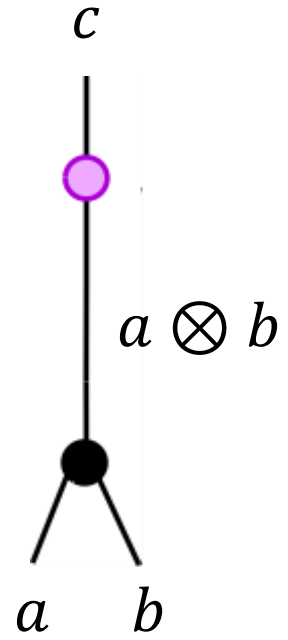
3-index symmetric tensor



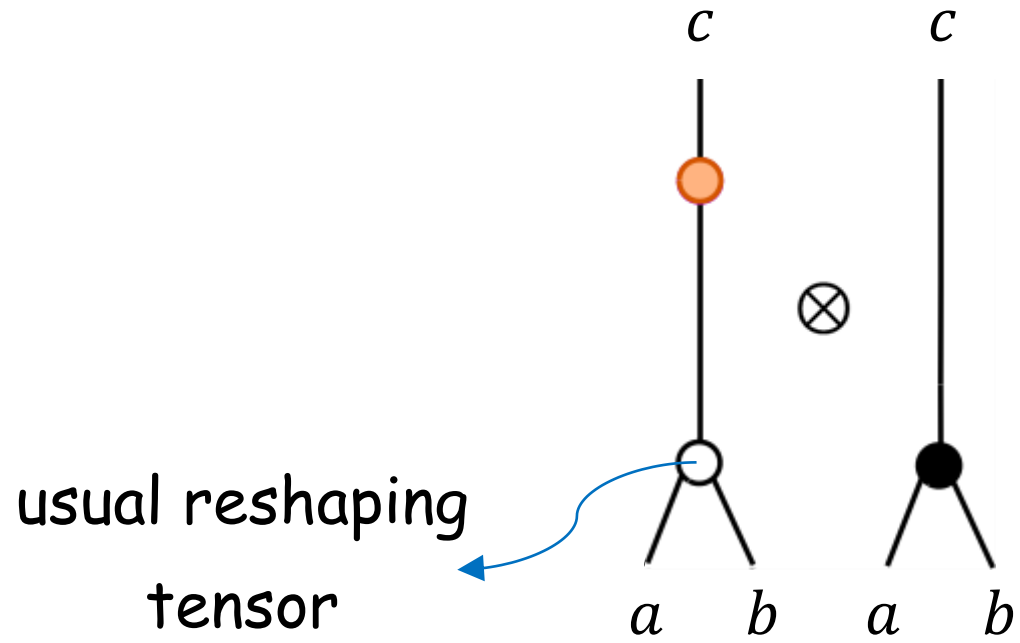
3-index symmetric tensor



3-index symmetric tensor



3-index symmetric tensor



3-index symmetric tensor

The diagram illustrates the decomposition of a 3-index symmetric tensor T into two components. On the left, a purple circle with three lines extending from it (top, bottom-left, bottom-right) is labeled T with indices c , a , and b respectively. This is followed by an equals sign. To the right of the equals sign is an orange circle with three lines extending from it, labeled "Degeneracy tensor" with a blue arrow pointing to it. This is followed by a tensor product symbol \otimes . To the right of the tensor product symbol is a black circle with three lines extending from it, labeled "Clebsch-Gordan tensor" with a blue arrow pointing to it. This tensor also has indices c , a , and b respectively.

$$T_{abc} = \text{Degeneracy tensor}_{abc} \otimes \text{Clebsch-Gordan tensor}_{abc}$$

T is identically zero if a, b, c are **incompatible**

That is, if irrep c **does not** appear in the tensor product of a & b

3-index symmetric tensor

$$T = \bigoplus_{abc} \text{ (orange vertex) } \otimes \text{ (black vertex) }$$

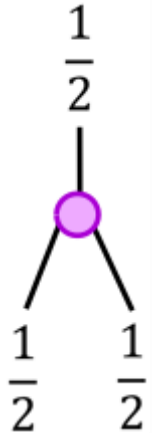
If more than one irrep appears on any index

T consists of blocks

Each block decomposes as in the previous slide

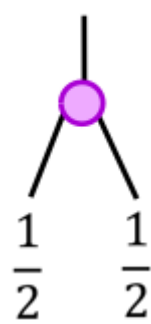
3-index symmetric tensor

Examples:



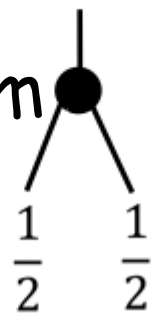
$\equiv 0$

$0 \oplus 1$



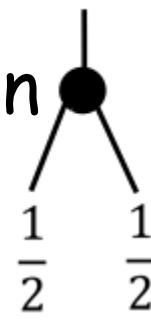
$= m$

0



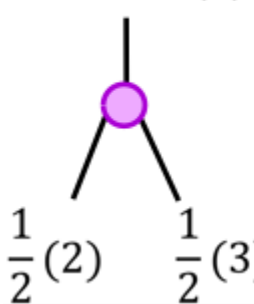
$\oplus n$

1

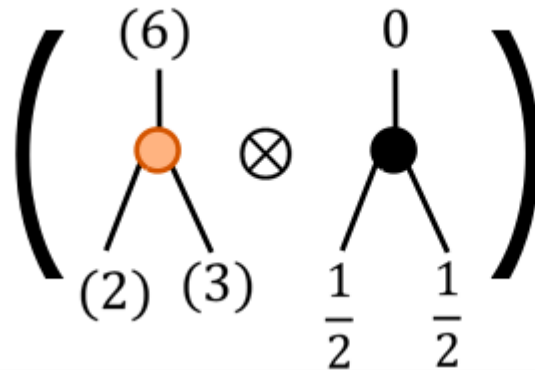


2 free parameters: m, n

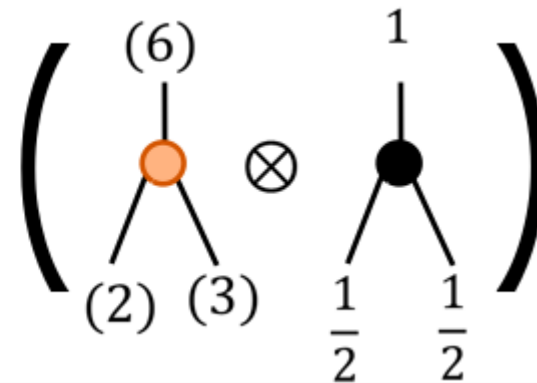
$0(6) \oplus 1(6)$



$=$



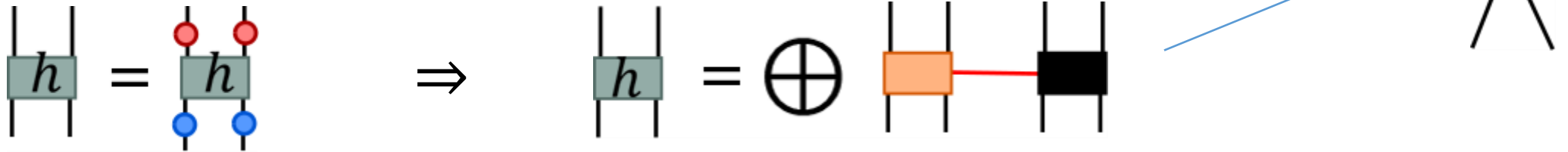
\oplus



$$4 \times 6 \times 24 = 576$$

$$2 \times 3 \times 6 + 2 \times 3 \times 6 = 72$$

4-index symmetric tensors

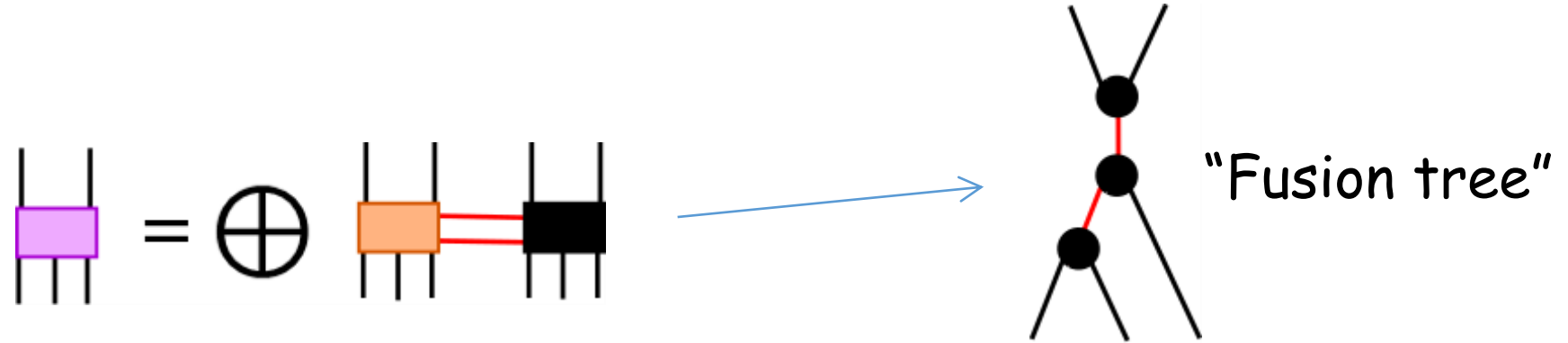


Symmetric tensors with more than 3 indices also decompose into degeneracy tensors and tensors that are determined by the symmetry.

But notice that an additional red index appears.

Red index is special: takes only j values (no m and t)

5-index symmetric tensors



Same story

But two red indices appears (in general, N -index tensor corresponds to $N-3$ red indices)

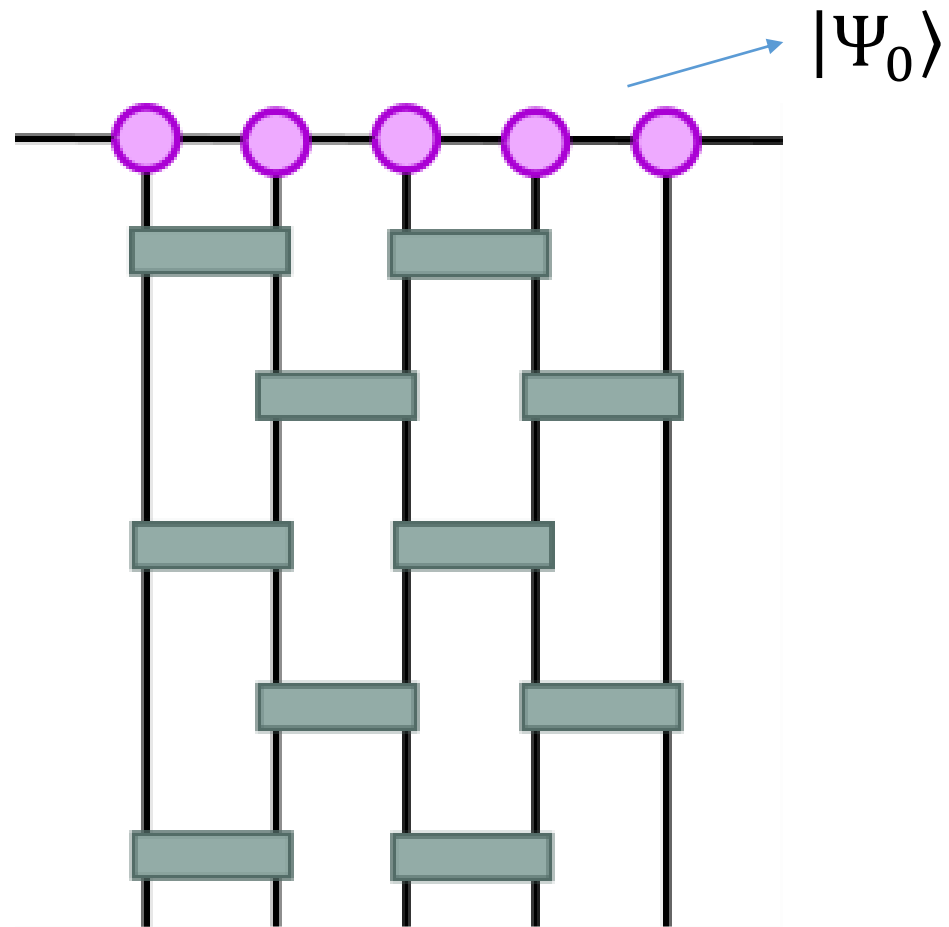
The black tensor decomposes as a tree of Clebsch-Gordan tensors.

And so on for tensors with more number of indices

The $SU(2)$ TEBD algorithm

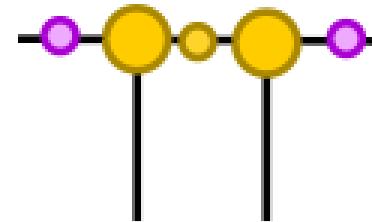
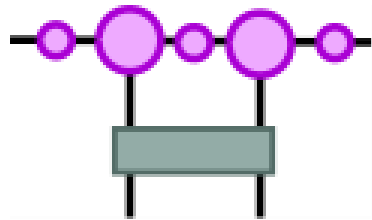
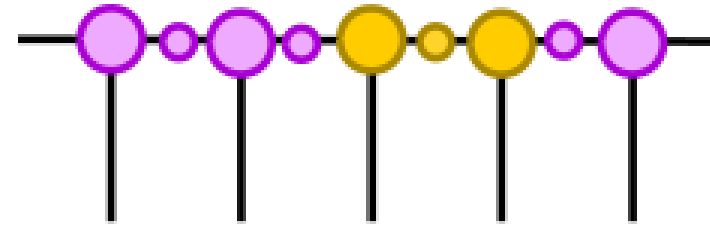
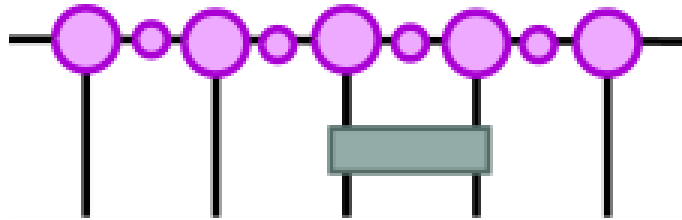
$$|\Psi\rangle = e^{iHt} |\Psi_0\rangle$$

infinite lattice

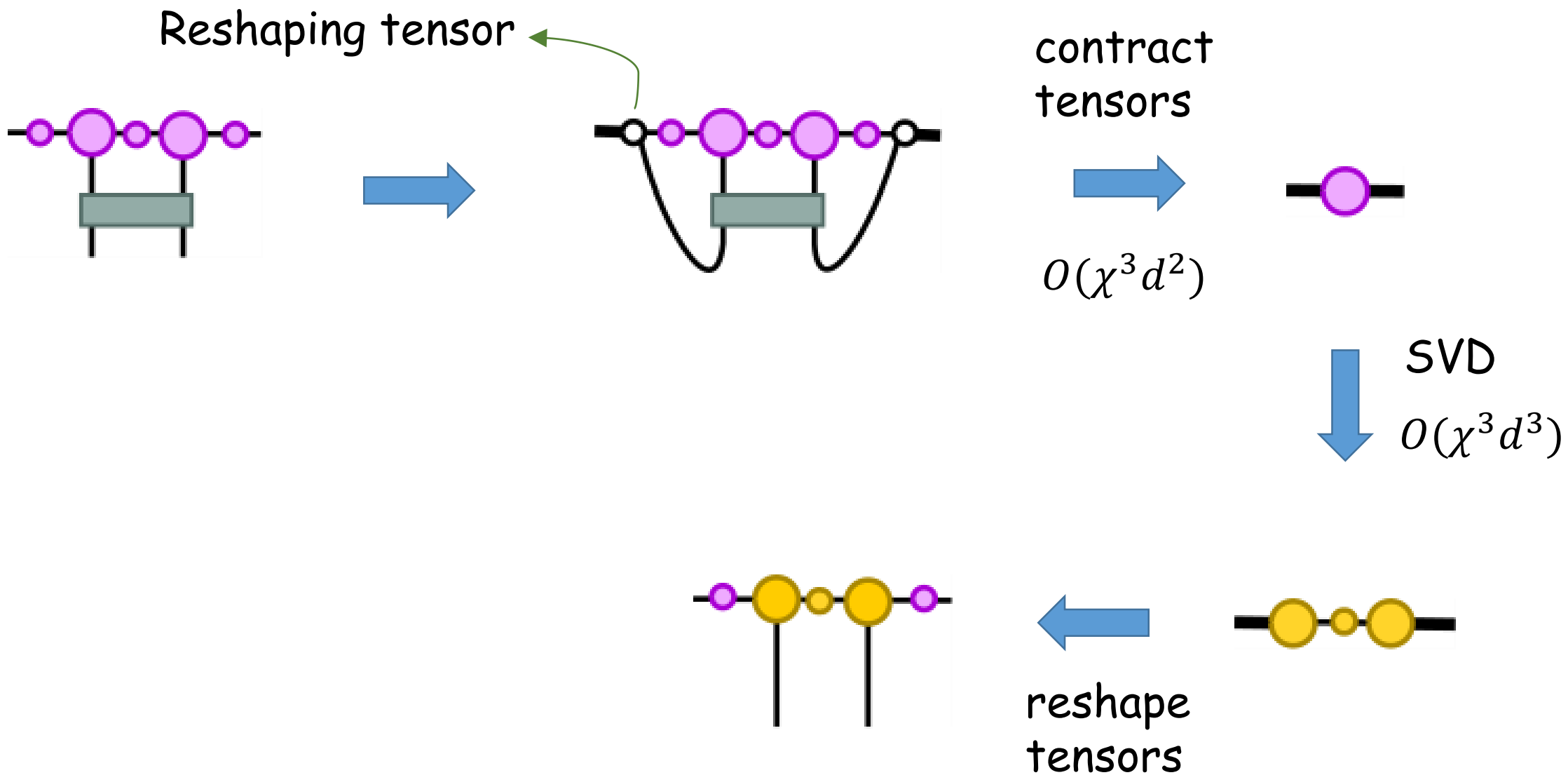


Main update in the TEBD algorithm

(MPS is in the canonical form)

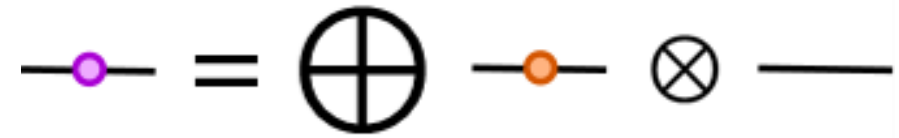


Main update in the TEBD algorithm



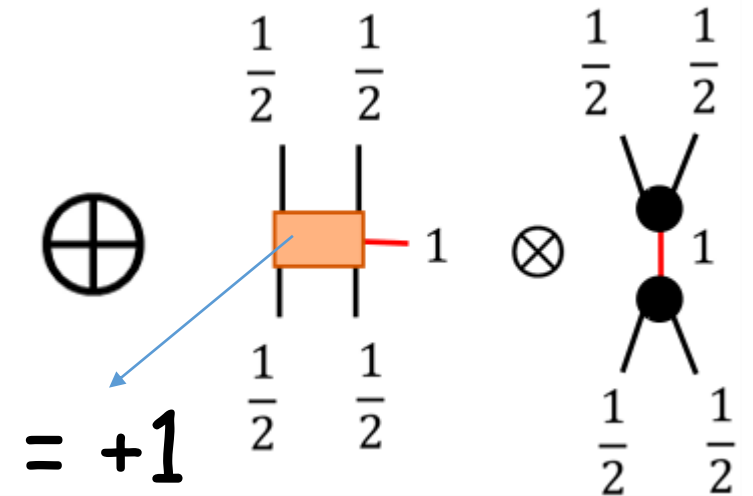
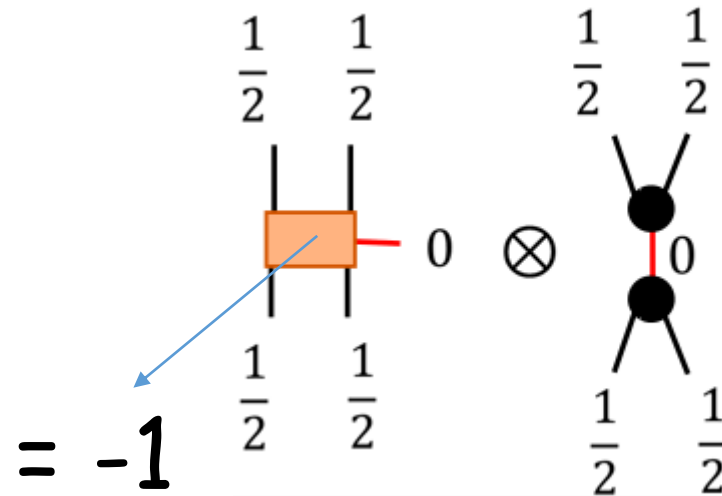
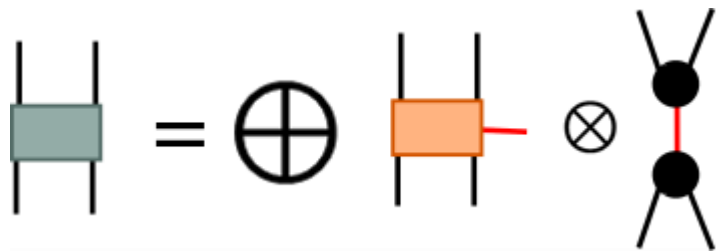
SU(2)-symmetric MPS

Express all tensors in the symmetric basis

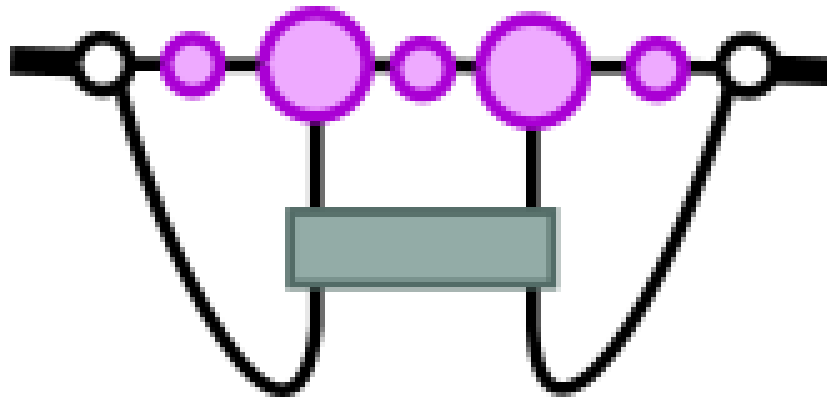


Hamiltonian.

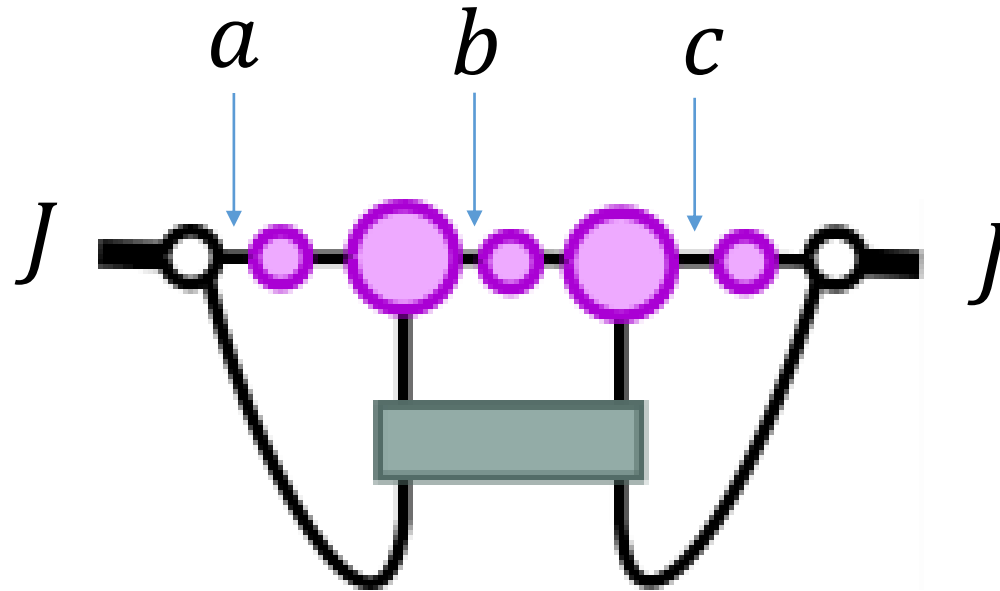
Example: Heisenberg model



$SU(2)$ -symmetric TEBD

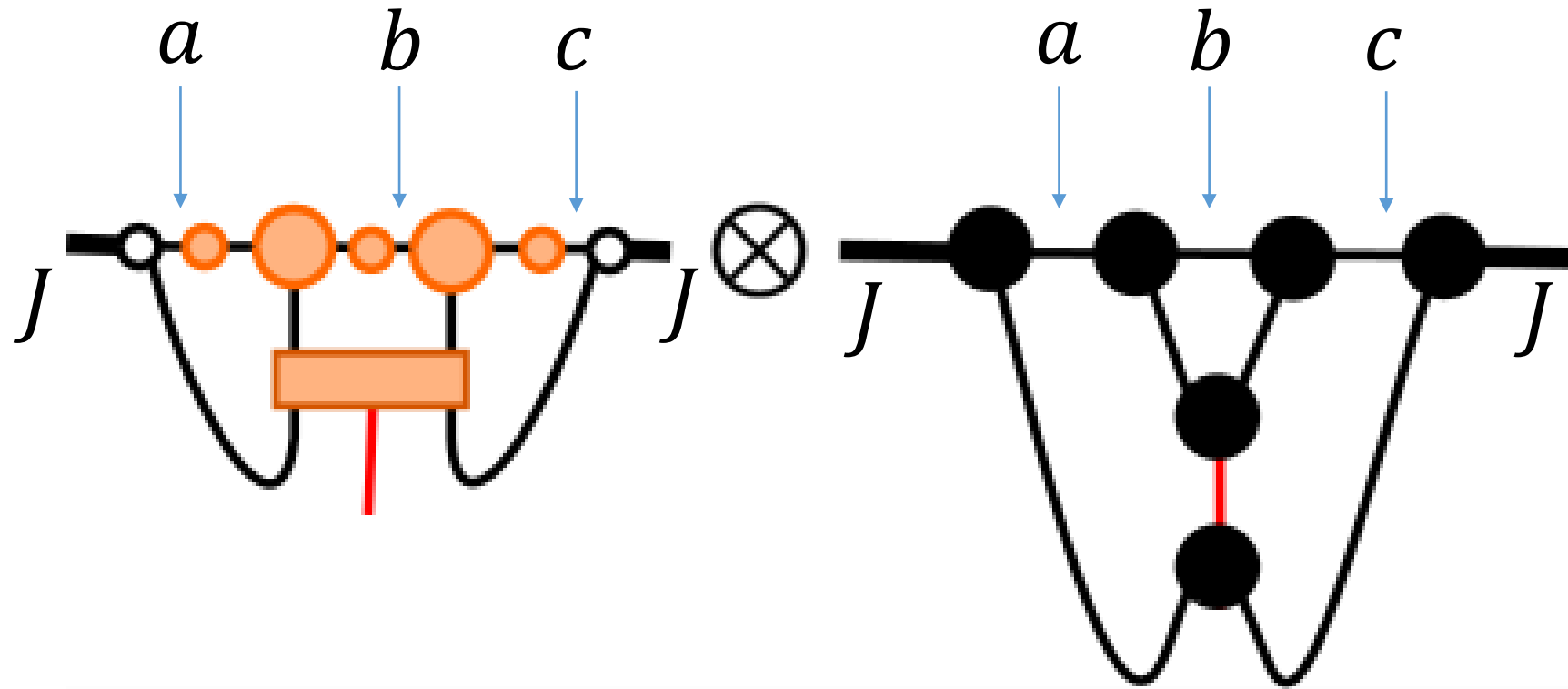


$SU(2)$ -symmetric TEBD



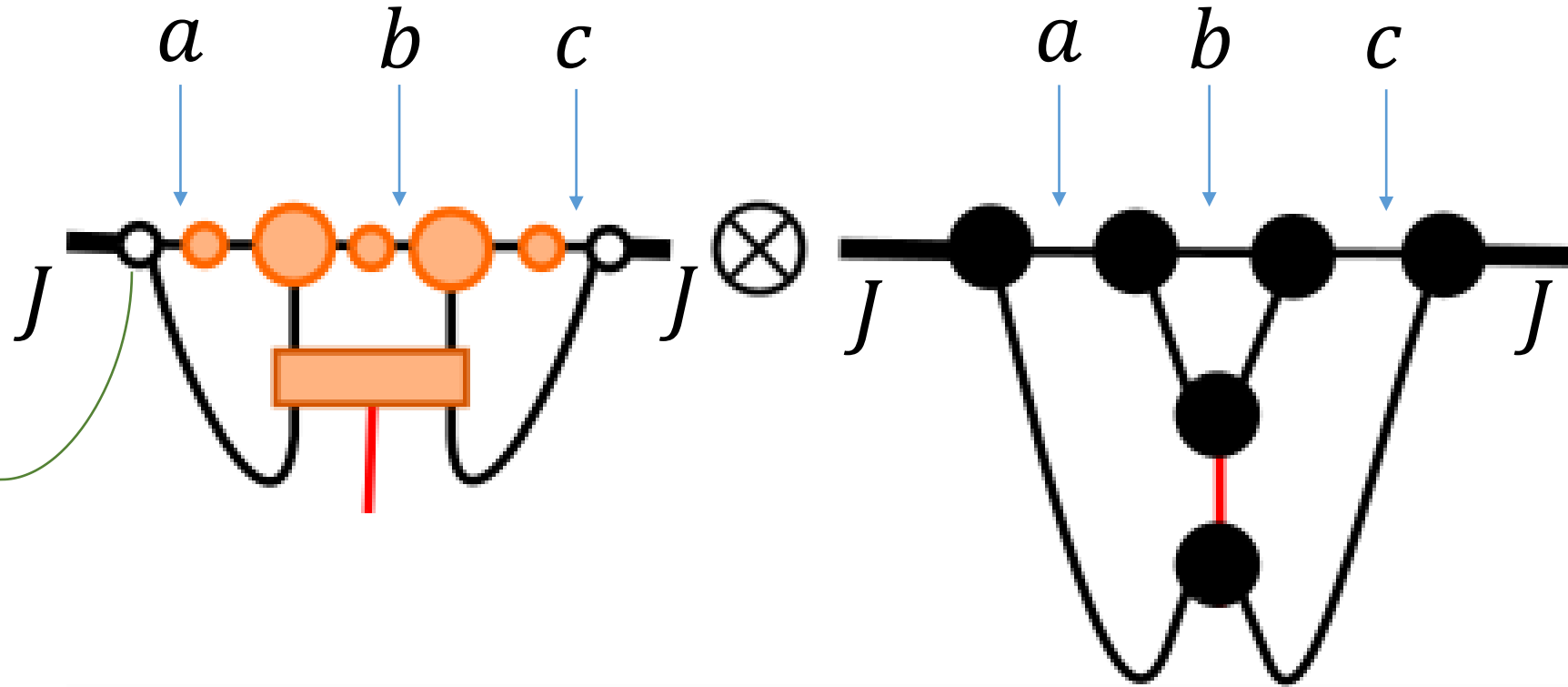
"irrep decoration"

SU(2)-symmetric TEBD



"irrep decoration"

SU(2)-symmetric TEBD



usual reshaping
tensor

"irrep decoration"

$$\text{Diagram 1} = \bigoplus_{\text{all decorations}} \text{Diagram 2} \otimes \boxed{\text{Diagram 3}} = \alpha \text{Diagram 4}$$

The full contraction reduces to contracting only the **much smaller** degeneracy tensors

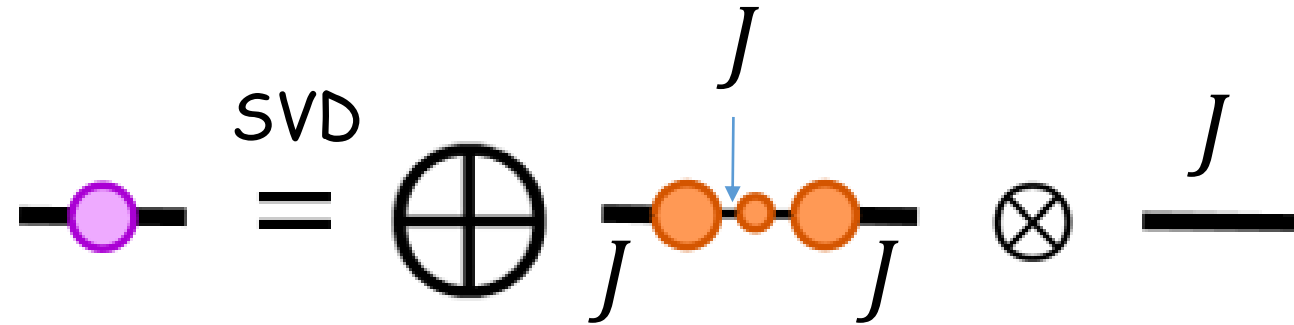
The black tensor network **need not** be contracted

Since the black tensor network is a symmetric matrix with **one** irrep on its (open) indices.

It is simply proportional to the Identity. (Schur's lemma)

The proportionality factor can be analytically obtained. It the product of two 6-j symbols here. Depends on the specific contraction.

SU(2)-symmetric TEBD



Can implement SVD **blockwise** for each J

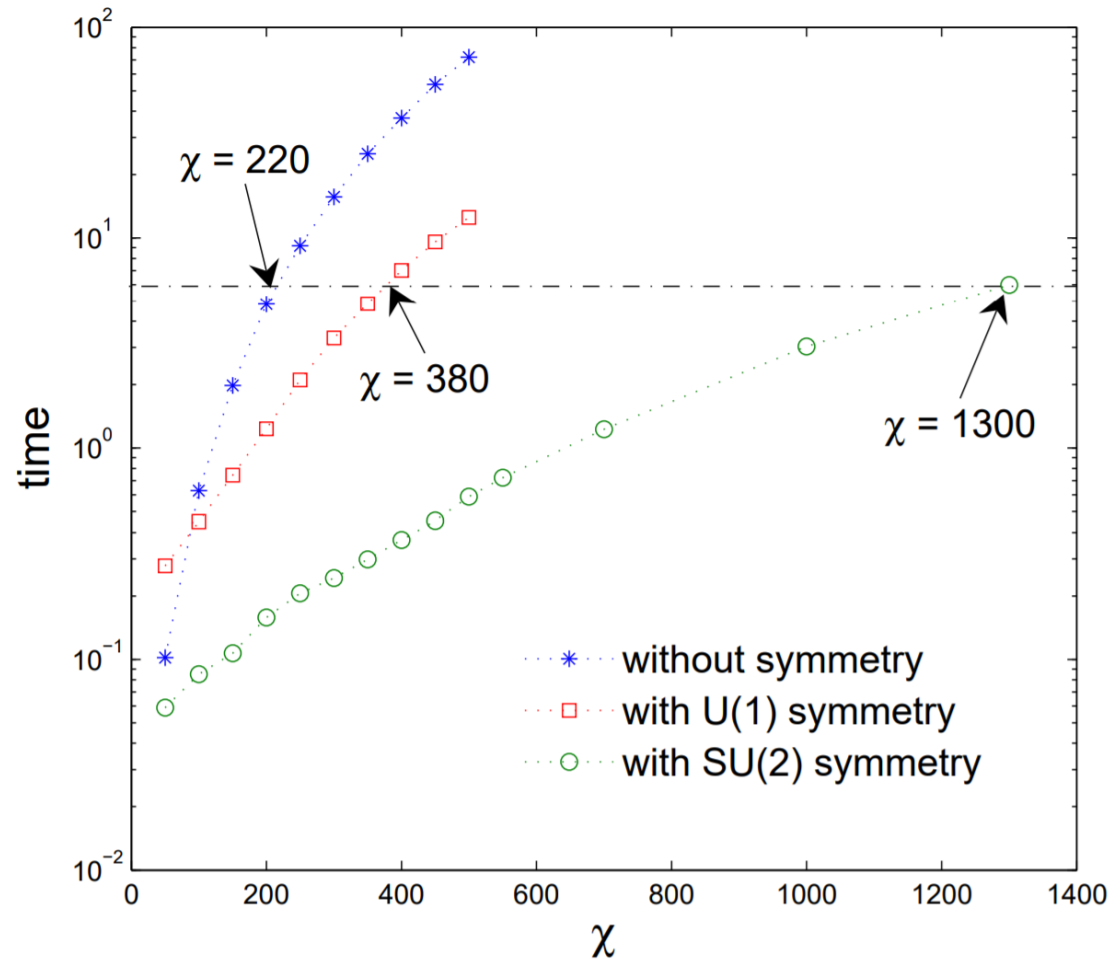
Only have to diagonalize the **much smaller** degeneracy matrices

New spins J can appear on the bonds of the updated MPS

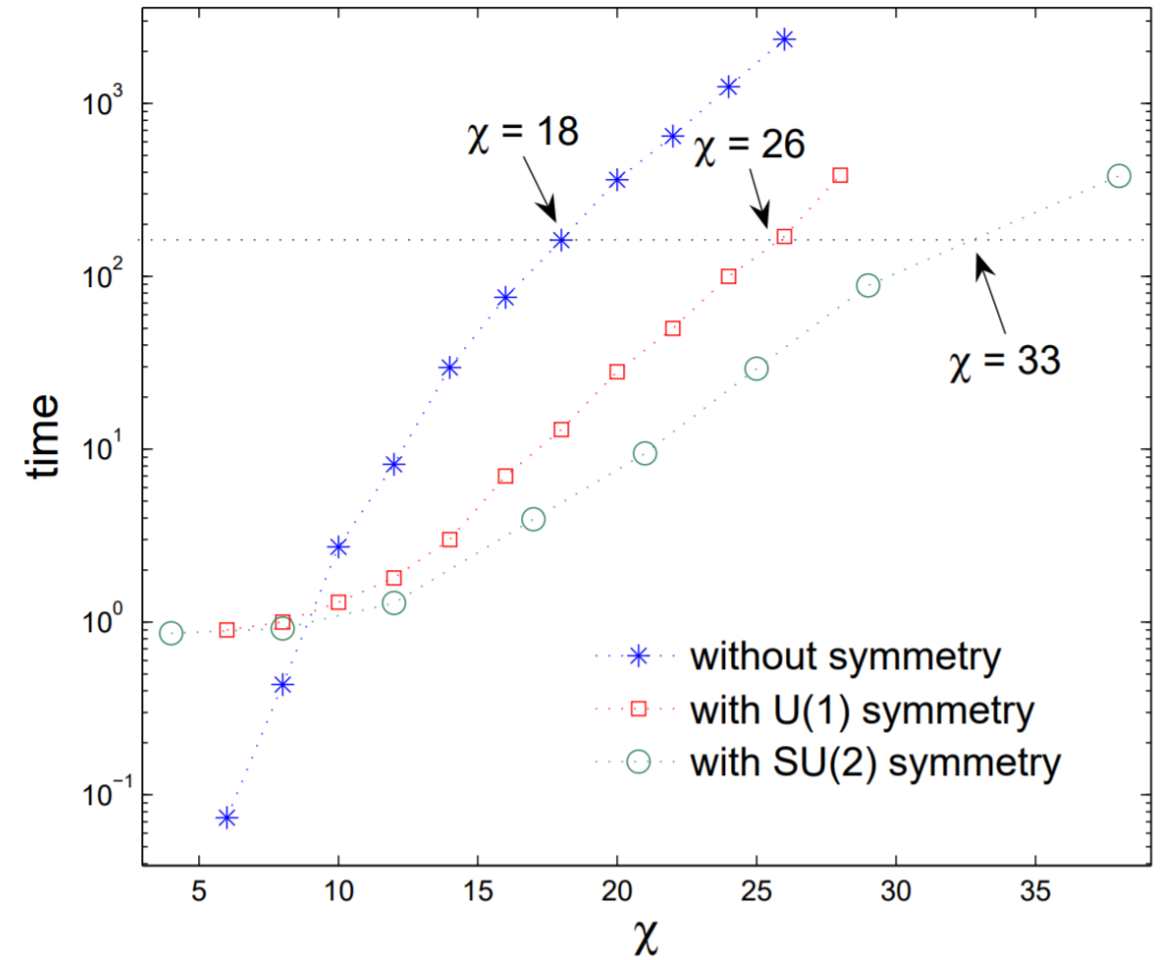
Significant cost reduction

Examples of computational speedup

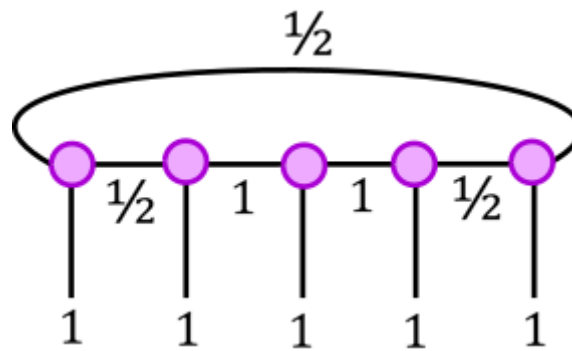
TEBD



MERA



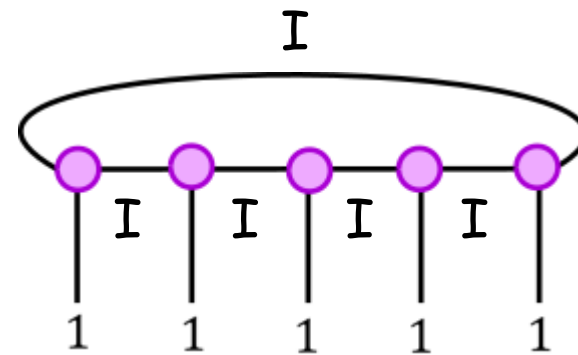
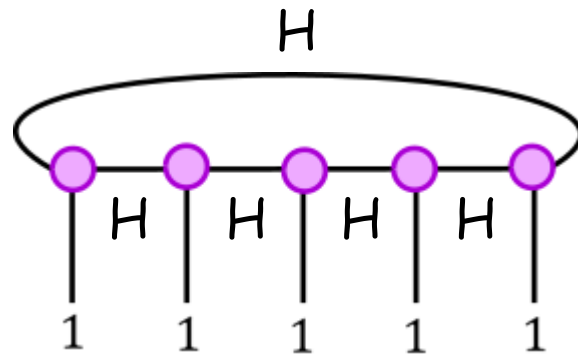
Using the symmetric MPS to detect phases



What's strange about this MPS? (All tensors are $SU(2)$ -symmetric)

It is **identically zero** because of **incompatible** bond irreps

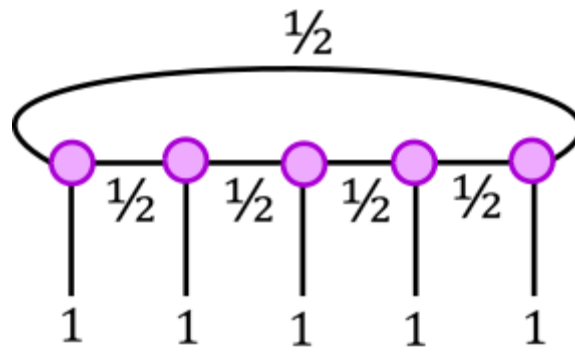
In fact, the only compatible decorations on an integer spin lattice are



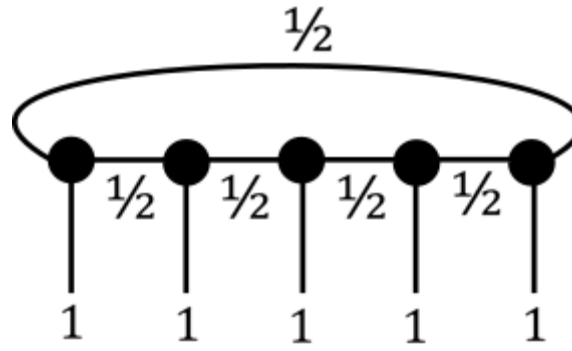
H : Half-integers

I : Integers

Simple example of state with half-integer bond irreps

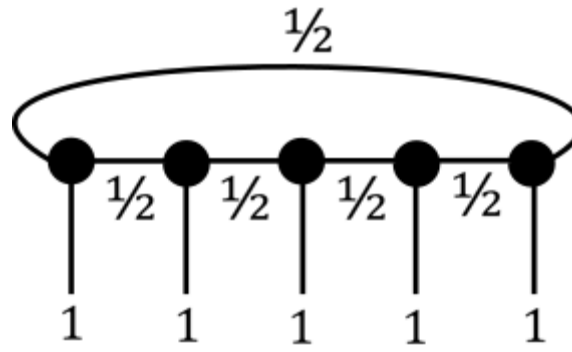


Simple example of state with half-integer bond irreps



The famous **AKLT state**

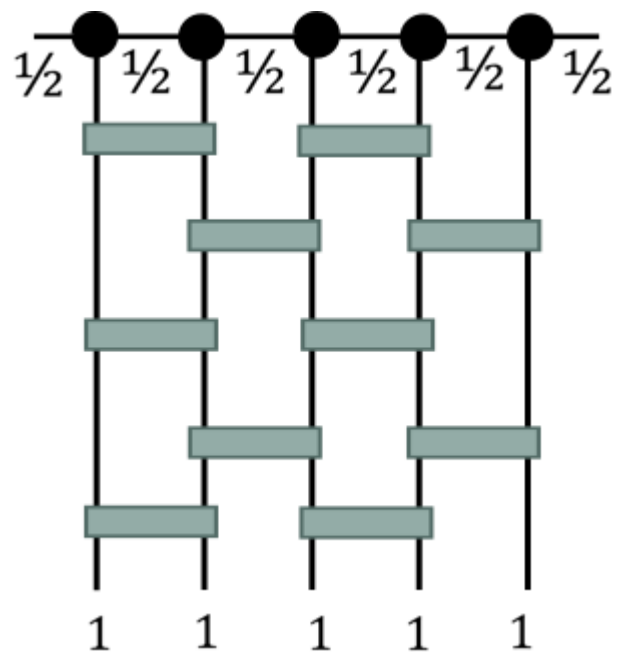
Simple example of state with half-integer bond irreps



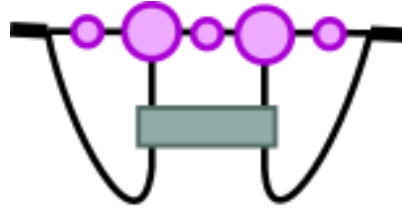
The famous **AKLT** state

Let us see what happens to the **bond spins**
if we time evolve for a **finite** time

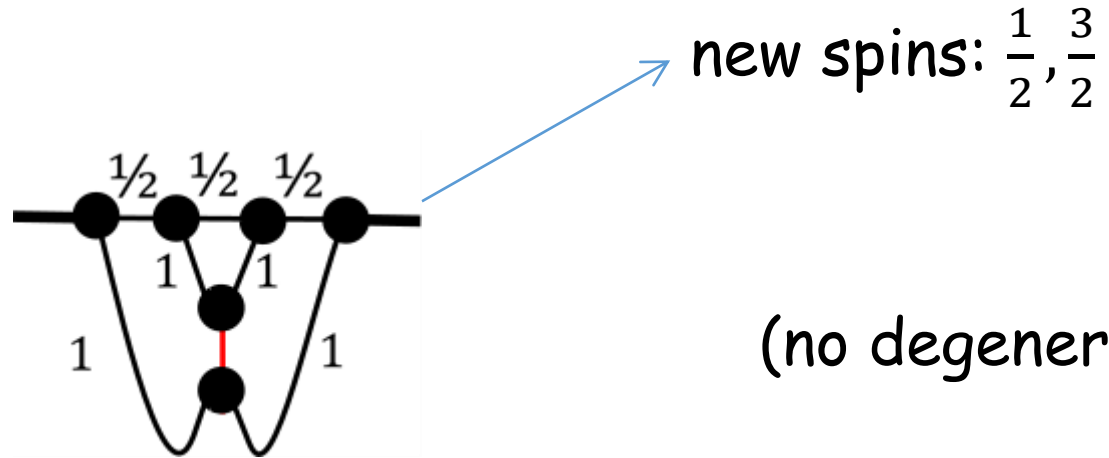
infinite lattice



Finite depth unitary circuit



This is the update step where new bond spins can appear.
(We only want to track if the class of irreps changes)



(no degeneracy part)

(red index = 0,1,2)

This is the update step where new bond spins can appear.

The new spins can only be half-integer.

This means that the AKLT state (or any half-integer bond state) cannot be transformed by a finite depth circuit to an integer bond state (and vice-versa).

Provided the circuit is symmetric! (Otherwise you can)

This means that half-integer and integer bond states belong to different phases.

These phase are different from usual ones e.g. the ordered and disordered phase in the quantum Ising model.

In the Ising model, the phase transition breaks the Z_2 symmetry.

In our case, both half-integer and integer bond states are symmetric.

These are examples of **symmetry protected topological phases**.

Since on a spin 1 lattice, the action of $SU(2)$ is isomorphic to $SO(3)$.

So while the AKLT state (or any half-integer bond state) only has $SO(3)$ symmetry, the tensors have an enhanced symmetry = $SU(2)$

Half-integer irreps are **projective representations** of $SO(3)$

This symmetry enhancement at the level of individual MPS tensors led to the classification of all 1d bosonic phases with a symmetry G

There is one phase for each equivalence class of projective representations of G
(For $SO(3)$ we have two phases)

In 1d systems, the only possible phases are symmetry breaking or symmetry protected topological phases (e.g. no intrinsic topological order)

A relevant problem is to **numerically** detect which phases can manifest in a given 1d lattice model.

Usual approach: use local or string order parameters.

But we can also use the symmetric MPS to detect phases, without the need for identifying any local or string order parameters.

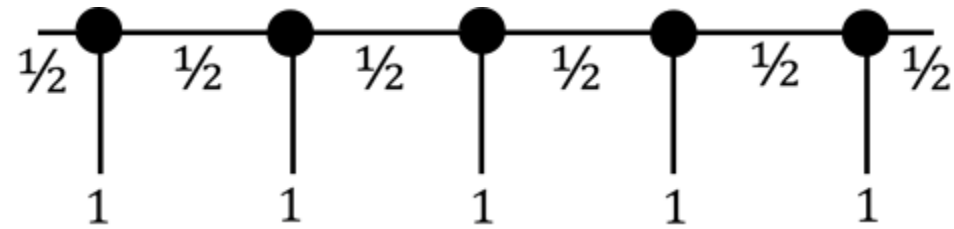
First, note that in e.g. TEBD the (equivalence) class of the bond irreps gets **fixed** by whatever is chosen in the initial state.

(Since we have seen that the update cannot change the class of the irreps, while preserving the symmetry.)

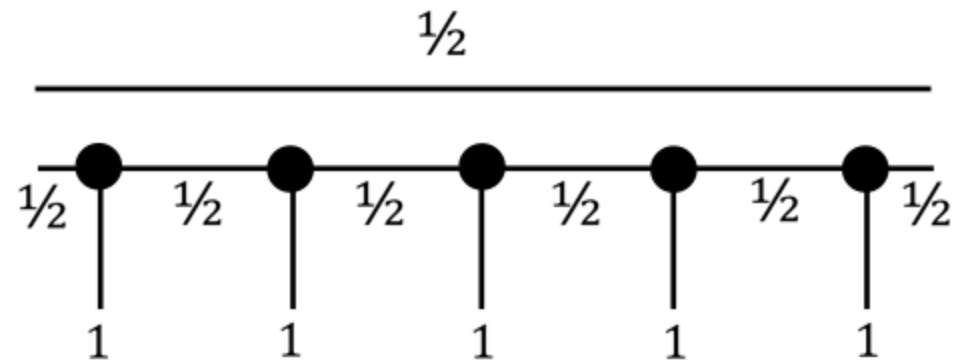
So what happens if we run a simulation for say the AKLT state (or any half-integer bond state) starting with an integer bond state!

Does the computer explode?

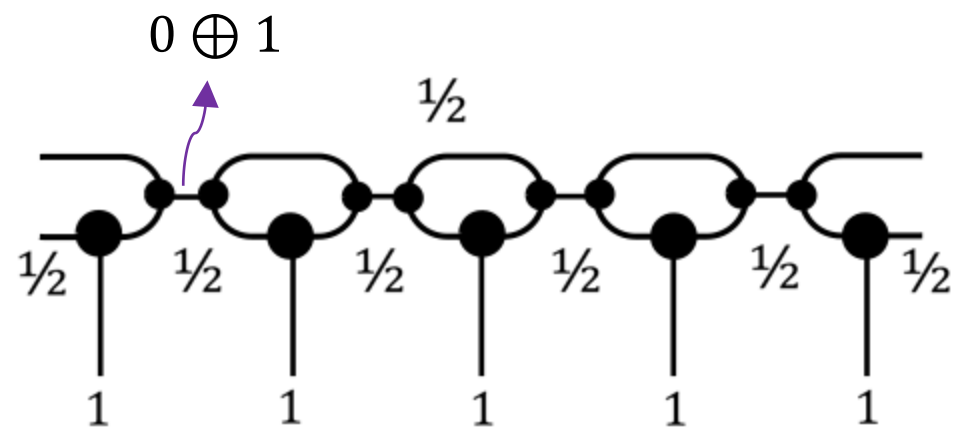
Thankfully no. Since the AKLT state can **also** be represented by integers bond spins.



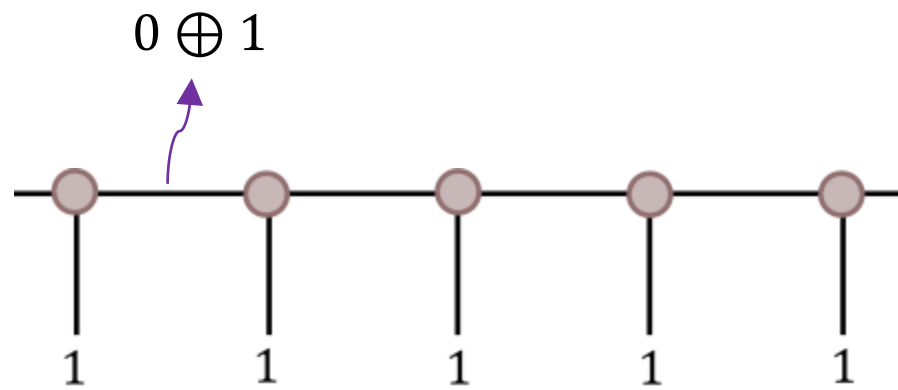
AKLT state on an infinite lattice



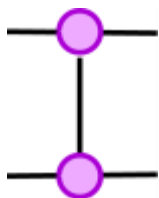
AKLT state on an infinite lattice



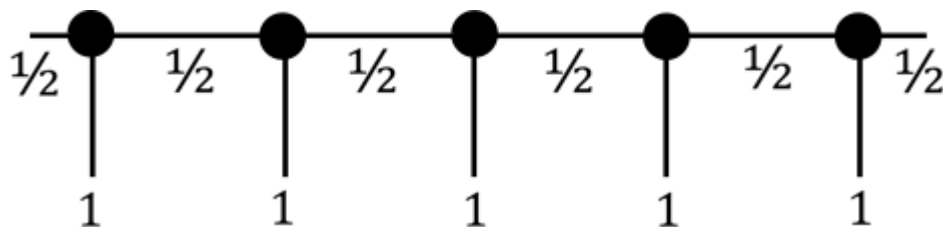
AKLT state on an infinite lattice



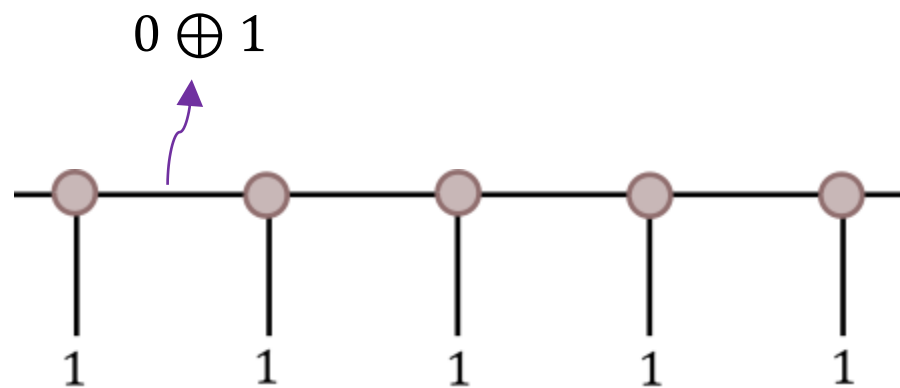
AKLT state on an infinite lattice



Transfer
matrix



injective



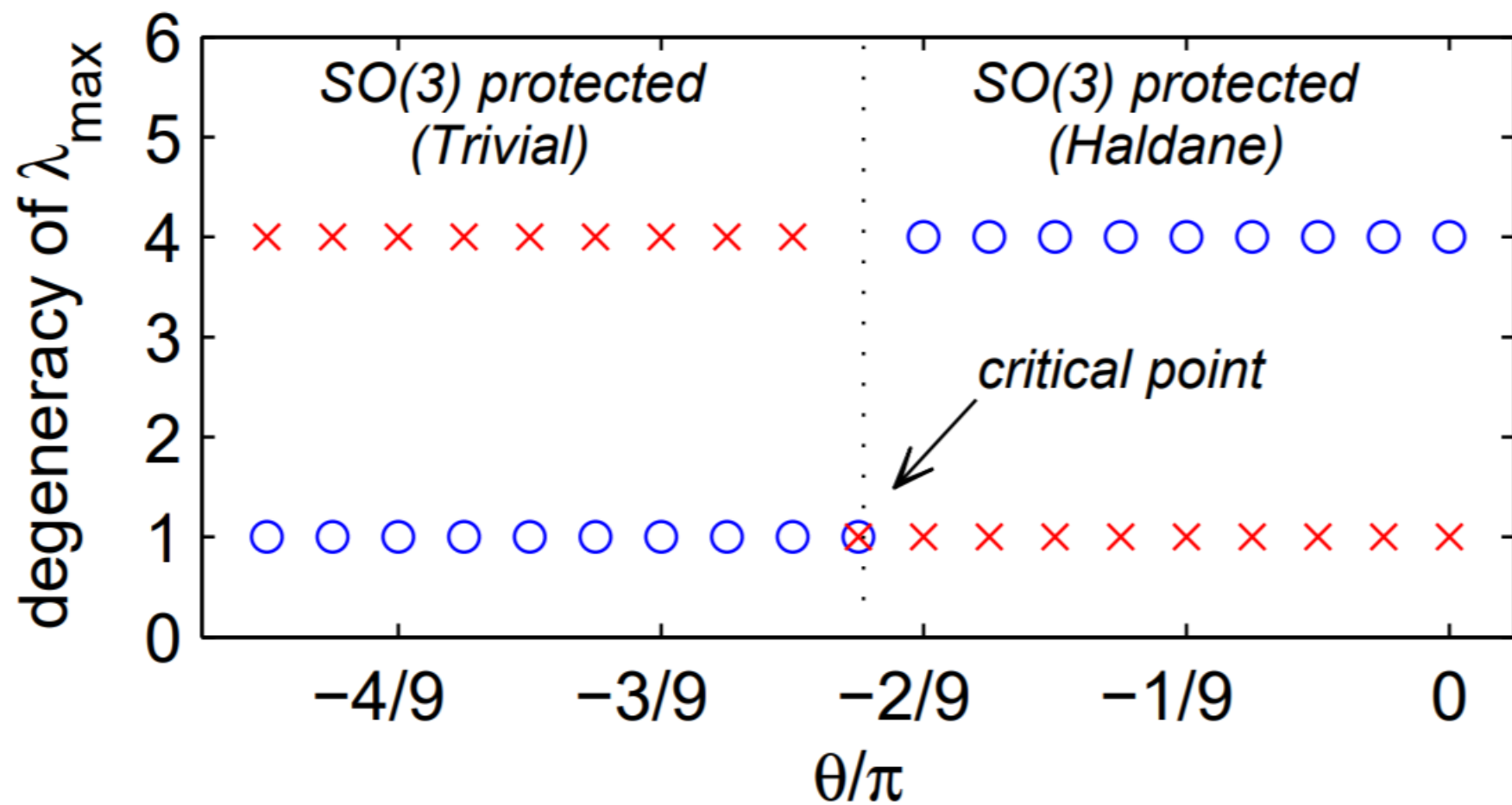
inflated

AKLT state on an infinite lattice

A simple phase detection algorithm for $SO(3)$

- 1) Begin with an initial state that is either an integer or half-integer bond state
- 2) In this way, find **two** MPS representations of the ground state: one with integer spins and one with half-integer spins (Recall that once we have chosen the class of irreps in the initial state, the algorithm preserves this choice)
- 3) The state belongs to the phase that corresponds to the bond irrep class that appears in the **injective** MPS.

$$\hat{H}^{\text{BLBQ}} = \sum_{k \in \mathcal{L}} \cos \theta \left(\vec{S}_k \vec{S}_{k+1} \right) + \sin \theta \left(\vec{S}_k \vec{S}_{k+1} \right)^2$$



A simple phase detection algorithm **for any group**

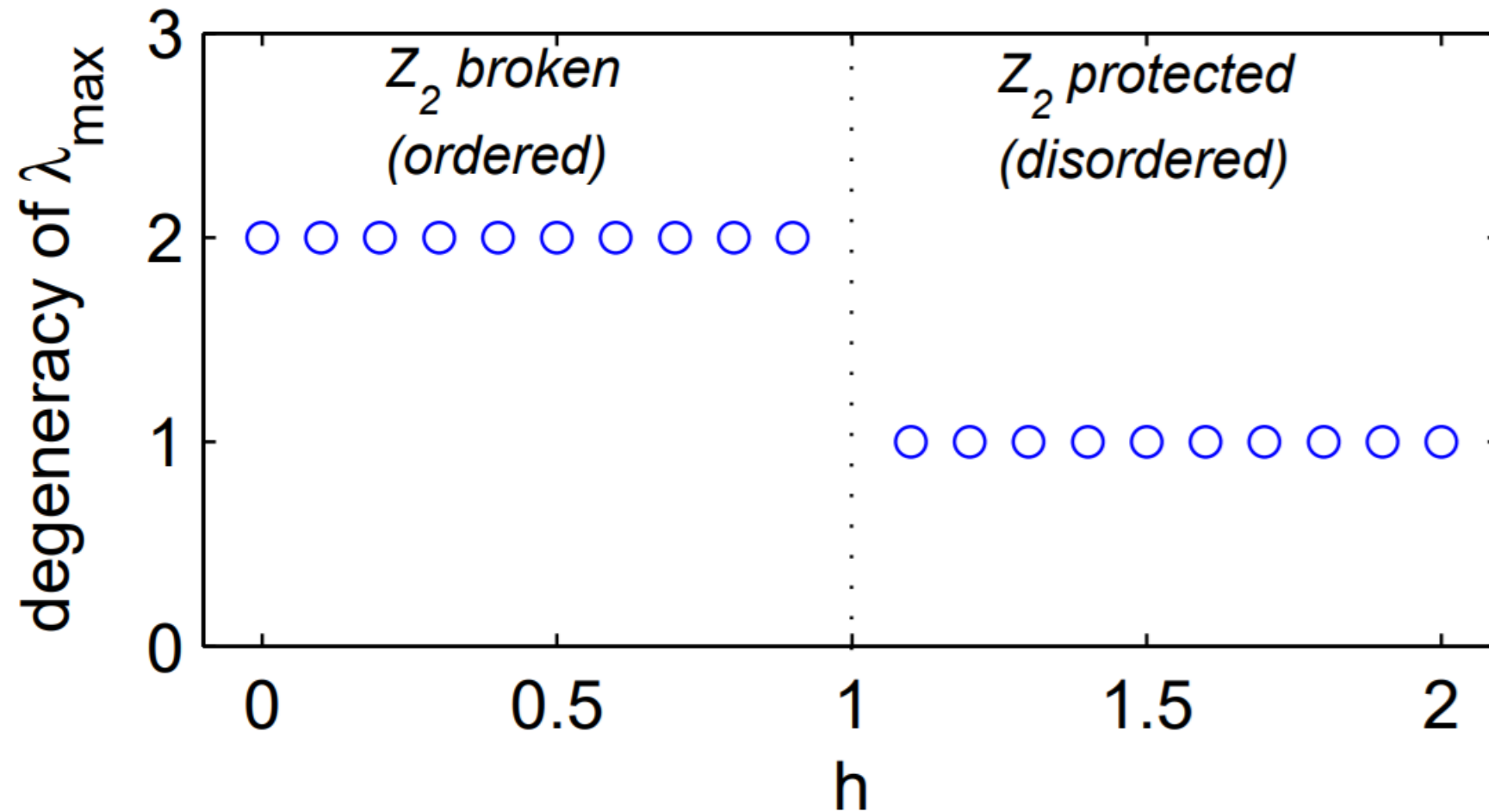
- 1) Projective representations of group are linear representations of another group called the **covering group** (also called representation group)
- 2) Implement the **covering group** symmetry in the MPS.
- 3) Find all MPS representations of the given ground state (by iterating over all the second cohomology classes of symmetry)
- 4) Only one MPS representations will be injective (rest are inflated).
- 5) Read off phase (bond irreps) from the injective MPS

Detecting symmetry breaking phases

- 1) Turns out that even symmetry breaking phases can be detected using symmetric tensors
- 2) A symmetry breaking phase is characterized by the presence of degenerate ground states, not all of which are symmetric.
- 3) But there are always ground states that are symmetric.
- 4) But the symmetric ground states are special in this case.
- 5) They are GHZ like states. $|0000 \dots\rangle + |1111 \dots\rangle$
- 6) Their MPS representation is non-injective! (Only the largest eigenvalue of the transfer matrix is degenerate.)

Example: 1d quantum Ising model

$$\hat{H}^{\text{ISING}} = \sum_{k \in \mathcal{L}} \hat{\sigma}_k^z \hat{\sigma}_{k+1}^z + h \hat{\sigma}_k^x$$

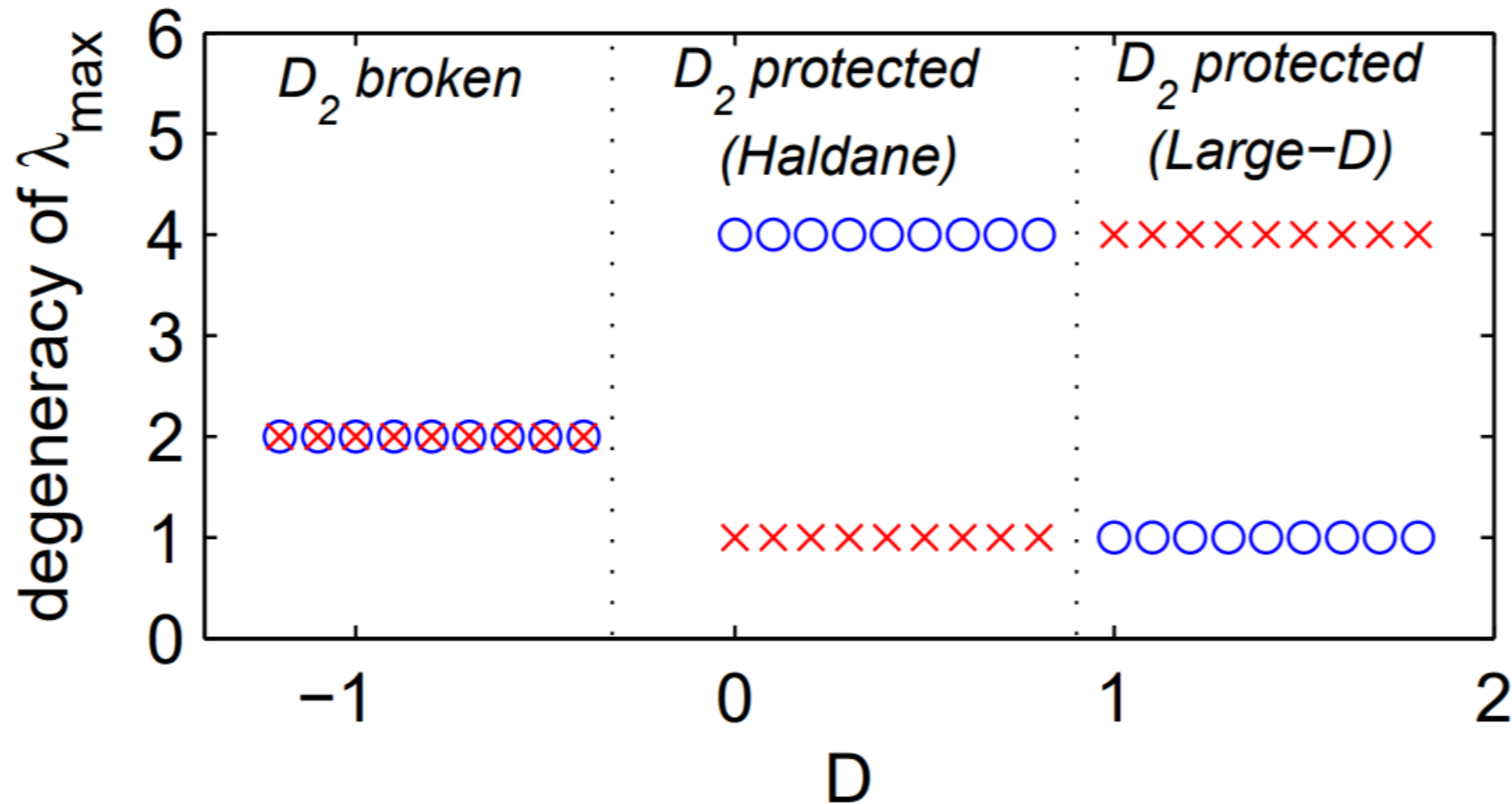


The **complete** phase detection algorithm

- 1) Find a set of MPS description of the ground state (one for each **different** projective representation)
- 2) Only one MPS will be injective (rest are inflated)
- 3) Read off phase from the injective MPS
- 4) If the MPS belongs to a phase in which the symmetry is broken then the MPS representation will be non-injective (**but not inflated**) for **any** projective representation

Example with symmetry protected & symmetry breaking phases

$$\hat{H}^{\text{HEIS}} = \sum_{k \in \mathcal{L}} \vec{S}_k \vec{S}_{k+1} + D(S_k^z)^2$$



Take home messages

- 1) Symmetric tensors are the basic building blocks in many symmetric tensor networks
- 2) Symmetric tensors are sparse in a particular basis (symmetry basis)
- 3) Only a small amount of data required from the symmetry: list of irreps, fusion rules, and F-symbols. **(The representation data of the symmetry.)**
- 4) Implementing symmetries has several benefits: speedup, targeting symmetry sectors, detection of phases etc.

Generalizations

Symmetries underlying Anyon models.

Not described by groups, but by fusion categories.

But a fusion category is simply a generalization of the representation data.

A fusion category is described by data similar to the representation data of a group

So the same code work by simply replacing the representation data.

Implementing gauge symmetries.

Thanks!

Implement global on-site symmetry first.

Then gauge the symmetry by inserting certain tensors in the tensor network.

References

- 1) S. Singh, H.-Q. Zhou, and G. Vidal, NJP (2010), arXiv:cond-mat/0701427
- 2) S. Singh, R. N. C. Pfeifer, and G. Vidal, PRA (R) (2010), arXiv:0907.2994
- 3) S. Singh, R. N. C. Pfeifer, and G. Vidal, PRB (2011), arXiv:1008.4774
- 4) S. Singh and G. Vidal, PRB (2012), arXiv:1208.3919
- 5) S. Singh and G. Vidal, PRB (2013), arXiv:1307.1522
- 6) S. Singh, R. N. C. Pfeifer, G. Vidal, and G. K. Brennen, PRB (2014), arXiv:1311.0967
- 7) S. Singh, PRB (2015), arXiv:1409.7873.