

## Introduction

In this lecture, we will show that :

- Quantum circuits can be described in terms of tensor networks.
- Tensor networks provide a common language for classical and quantum algorithms.
- In certain cases, the use of a quantum computer may allow for exponential speedups in tensor network contraction

# MPS and canonical form revisited

Let us start by reminding ourselves of the general ideas of MPS, the diagrammatic notation, and canonical form. For concreteness we will consider only spin- $1/2$  degrees of freedom.

Main idea is to represent / approximate the many-body quantum states by the product of tensors (matrices in 1D). That is, for a quantum state of  $N$  spin- $1/2$ ,

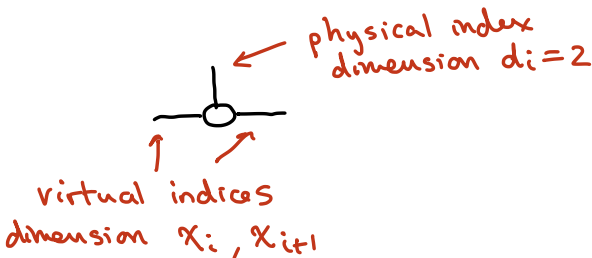
$$|\psi\rangle = \sum_{i_1 \dots i_N = \uparrow, \downarrow} \psi_{i_1 \dots i_N} |i_1 \dots i_N\rangle,$$

We can write the probability amplitudes as

$$\psi_{i_1 \dots i_N} = \text{[Diagram: a light blue horizontal bar with vertical lines on top representing indices]} \approx \text{[Diagram: a sequence of circles connected by horizontal lines representing tensors]}.$$

↑  
may be an equality  
for particular states or  
for certain bond dimension  $\chi$

The state is now written as a product of tensors

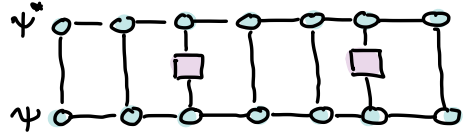
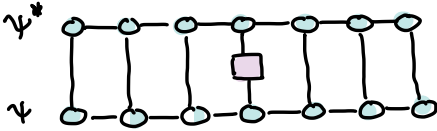


Given the MPS, our goal is typically to compute local observables that correspond to measurable quantities, e.g.

$$\langle \psi | \sigma_i^z | \psi \rangle$$

or

$$\langle \psi | \sigma_i^x \sigma_j^x | \psi \rangle$$



And the beauty of using MPS is that the computational cost is polynomial in both the number of sites  $N$  and the bond dimension  $\chi_{\max}$ , in contrast to the brute-force exponential cost in  $N$ .

### Canonical form & Isometric form

There is a gauge freedom in how we specify the tensors in the MPS, but there are particularly useful **canonical forms**. These have two conditions

#### Left canonical

$$(1) \quad \begin{array}{c} \textcircled{A^*} \\ | \\ \textcircled{A} \end{array} = \mathbb{1} \quad \left( \right)$$

$$(2) \quad \begin{array}{c} \textcircled{A^*} \\ | \\ \textcircled{A} \end{array} \textcircled{\Lambda^2} = \textcircled{\Lambda^2}$$

$[\Lambda]_{ij} = \lambda_i \delta_{ij}$   
the Schmidt values.

#### Right canonical

$$\left( \right) \mathbb{1} = \begin{array}{c} \textcircled{B^*} \\ | \\ \textcircled{B} \end{array}$$

$$\left( \right) \textcircled{\Lambda^2} = \begin{array}{c} \textcircled{B^*} \\ | \\ \textcircled{\Lambda^2} \\ | \\ \textcircled{B} \end{array}$$

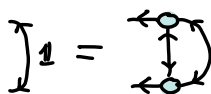
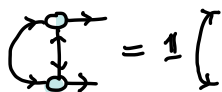
If we relax the second condition then we get the slightly more general **isometric form**. To deal with the isometric form we can introduce a new arrow notation, namely

left isometric

right isometric



(Isometry condition)



The convention of the arrows is such that the total dimension of ingoing arrows  $\geq$  outgoing arrows.

By grouping legs, we can talk about isometric matrices

Let  $A$  be a  $M \times N$  matrix with  $M \geq N$   
then  $A$  is an isometry iff

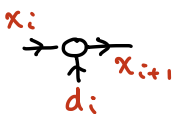
$$A^+ A = \mathbb{1}_{N \times N} \quad \text{and} \quad A A^+ = P_{M \times M}$$

where  $P_{M \times M}$  is a projector ( $P^2 = P$  with  $\text{rank}(P) \leq N$ )

Note for an MPS

$$d_i \chi_i \geq \chi_{i+1}$$

Similarly  $\chi_i \leq d_i \chi_{i+1}$



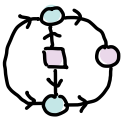
Also note that that we assume.

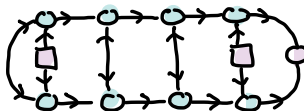
$$\text{rank}(P) = N$$

for MPS, otherwise there is redundancy in the MPS.

Canonical form and isometric form allow us to more efficiently compute observables.

E.g.

$$\langle \psi | \sigma_i^z | \psi \rangle =$$


$$\langle \psi | \sigma_i^x \sigma_j^x | \psi \rangle =$$


# Quantum Circuits

Quantum circuits are the leading model for quantum computing. Just like with tensor networks, it is typical to work with diagrams. Typically they consist of three parts:

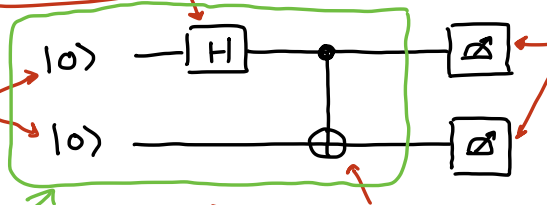
- an initial state, normally the product state  $|00\dots 00\rangle \sim |\uparrow\uparrow\dots\uparrow\rangle$
- Unitary gates (operators)
- Measurements.

Note we typically deal with qubits where  $|0\rangle \sim |\uparrow\rangle$   
 $|1\rangle \sim |\downarrow\rangle$

An example quantum circuit that creates and measures the Bell state  $|\psi\rangle = \frac{1}{\sqrt{2}}(|00\rangle + |11\rangle)$

Hadamard gate  $|0\rangle \xrightarrow{H} \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)$   
 $H = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 \\ 1 & -1 \end{pmatrix}$

Initial state  $|00\rangle = |0\rangle \otimes |0\rangle$

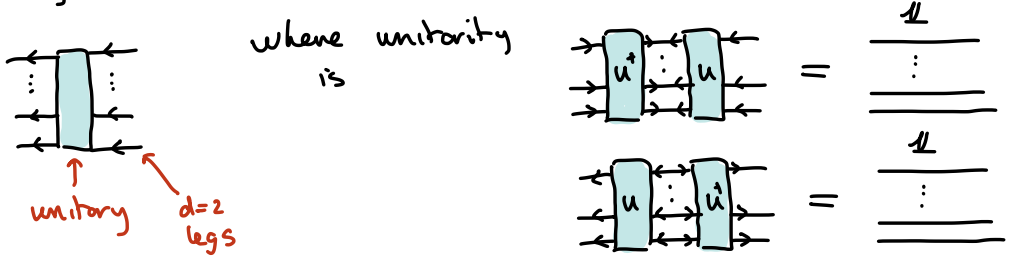


Measurement result collapses onto computational basis states  $|00\rangle, |01\rangle, |10\rangle, |11\rangle$

CNOT gate Non-separable  
 $CNOT = \begin{pmatrix} 1 & \dots & \dots & \dots \\ \dots & 1 & \dots & \dots \\ \dots & \dots & \dots & 1 \\ \dots & \dots & 1 & \dots \end{pmatrix}$   
 $CNOT \neq A \otimes B$

For our purposes we will ignore the subtleties with measurement. Initial state + unitary gates = new state.  
Assume we can extract  $\langle \psi | \sigma_i^x | \psi \rangle$  or  $\langle \psi | \sigma_i^y | \psi \rangle$

In anticipation, let us denote a general unitary using arrow notation, i.e.

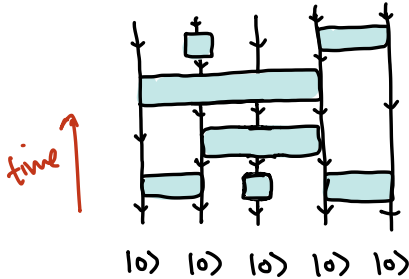


Note that a unitary is an isometry where the incoming and outgoing dimensions match.

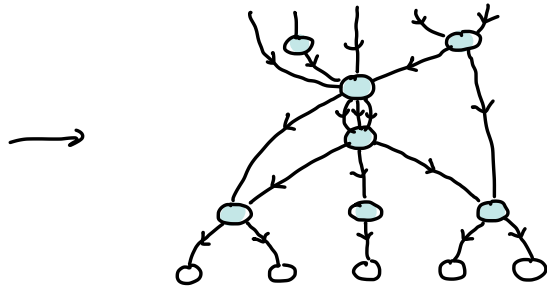
- Hadamard had 1 ingoing/outgoing  $\leftarrow \text{H} \leftarrow$
- CNOT had 2 ingoing/outgoing  $\leftarrow \text{CNOT} \leftarrow$

More generally, a quantum circuit is of the form

Quantum circuit



tensor network



Unitary circuit is an tensor network in isometric form where unitary gates have equal number of incoming and outgoing legs.

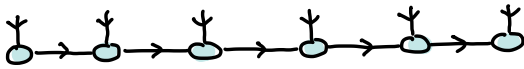
Note: I will typically draw my unitary circuits with time going vertically, which is not standard!

## Mapping MPS to sequential quantum circuits

We can do better than simply noting that we can interpret quantum circuits as tensor networks.

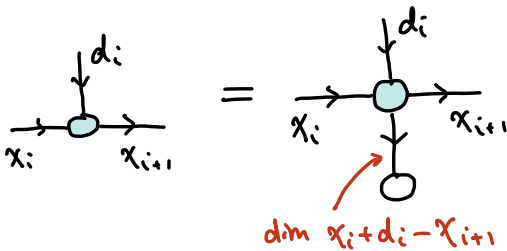
There is an exact mapping between MPS and certain sequential quantum circuits.

Let us start with an MPS in left canonical form



And consider a single isometric tensor. We will consider bond dimensions  $\chi_i, \chi_{i+1}$  that are powers of 2 for simplicity.

We can then promote these isometries to unitaries + projectors



Note: We can embed a tensor in one of the power of 2 form. We embed each matrix as the upper left block and place a maximal rank projector in the bottom right block.

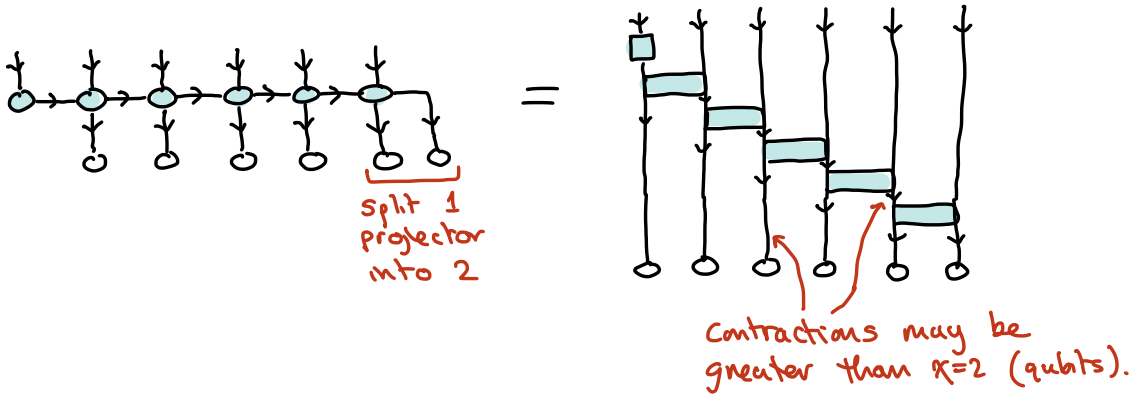
e.g.  $3 \times 5$

$$B^{[i]} = \begin{pmatrix} \vdots & \vdots & \vdots & \vdots & \vdots \\ \vdots & \vdots & \vdots & \vdots & \vdots \\ \vdots & \vdots & \vdots & \vdots & \vdots \end{pmatrix} \rightarrow \begin{pmatrix} \vdots & \vdots & \vdots & \vdots & \vdots \\ \vdots & \vdots & \vdots & \vdots & \vdots \\ \vdots & \vdots & \vdots & \vdots & \vdots \\ \hline & & & 1 & 0 & 0 \end{pmatrix}$$

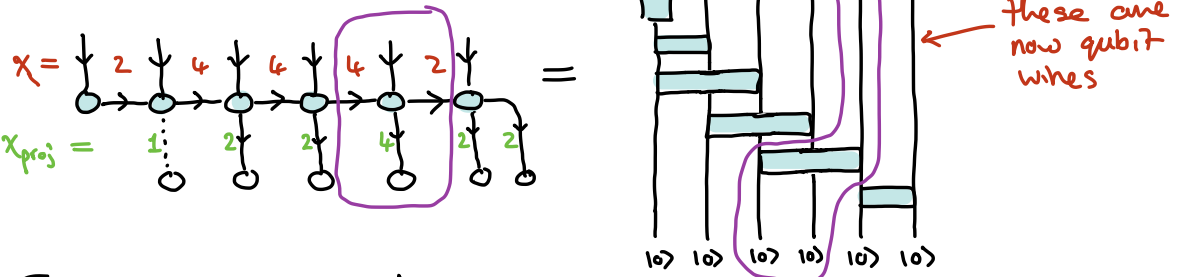
we can choose the projector w.l.g. to be  $[1, 0, 0, \dots]$ , and then use QR-decomposition to find the corresponding unitary. It will be easiest to demonstrate this when we work through an explicit example.



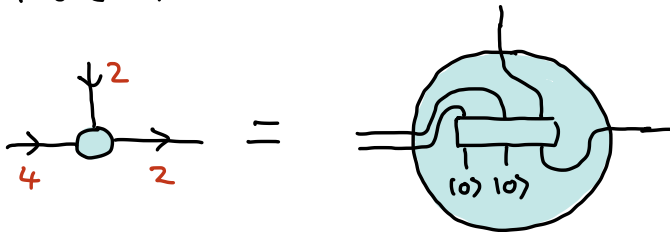
The MPS can then be written as



Consider an example.



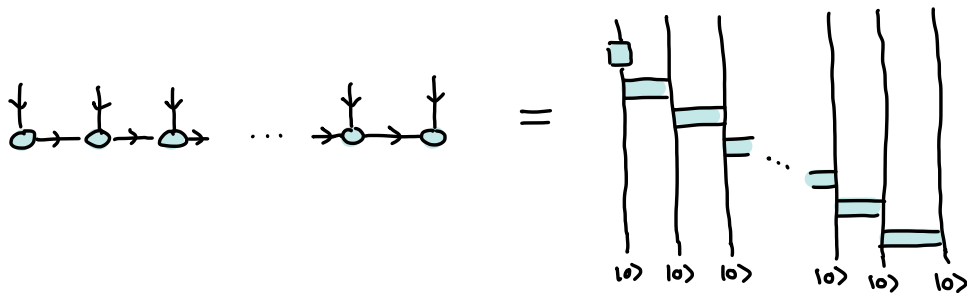
Focussing on one tensor



## Explicit Example : GHZ state

The GHZ state  $|4\rangle = \frac{1}{\sqrt{2}} (|1\uparrow\uparrow\dots\uparrow\rangle + |1\downarrow\downarrow\dots\downarrow\rangle)$   
 $= \frac{1}{\sqrt{2}} (|100\dots 0\rangle + |111\dots 1\rangle)$

Is exactly represented by a  $\chi=2$  MPS



Where the MPS tensors are

$$A^{[1]\uparrow} = (1, 0) \quad A^{[i]\uparrow} = \begin{pmatrix} 1 & 0 \\ 0 & 0 \end{pmatrix} \quad A^{[N]\uparrow} = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 \\ 0 \end{pmatrix}$$

$$A^{[1]\downarrow} = (0, 1) \quad A^{[i]\downarrow} = \begin{pmatrix} 0 & 0 \\ 0 & 1 \end{pmatrix} \quad A^{[N]\downarrow} = \frac{1}{\sqrt{2}} \begin{pmatrix} 0 \\ 1 \end{pmatrix}$$

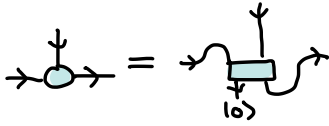
The easiest unitary to find corresponds to  $A^{[i]}$  since this is already unitary

$$U = \begin{pmatrix} 1 & 0 \\ 0 & 1 \end{pmatrix} \quad A^{[i]\uparrow} = (1, 0)$$

$$A^{[i]\downarrow} = (0, 1)$$

the first unitary is the identity  $\square = |$

Let's next consider the unitary corresponding to  $A^{(i)}$



$$U = \begin{pmatrix} 1 & 0 & \cdot & \cdot \\ 0 & 0 & \cdot & \cdot \\ 0 & 0 & \cdot & \cdot \\ 0 & 1 & \cdot & \cdot \end{pmatrix}$$

$$A^{(i)\dagger} = \begin{pmatrix} 1 & 0 \\ 0 & 0 \end{pmatrix}$$

$$A^{(i)b} = \begin{pmatrix} 0 & 0 \\ 0 & 1 \end{pmatrix}$$

↑ need to find two columns such that all columns are orthonormal

We can find missing columns by Gram-Schmidt.

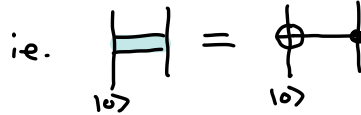
Equivalently, randomly fill columns and use QR-decomposition

$$M = QR, \quad Q\text{-unitary}, \quad R\text{-upper triangular.}$$

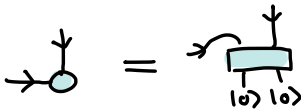
The choice of unitary is not unique!

One choice that works is

$$U = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 1 \\ 0 & 0 & 1 & 0 \\ 0 & 1 & 0 & 0 \end{pmatrix} = \text{CNOT}_{21}$$



The final unitary to find corresponds to  $A^{(N)}$ .



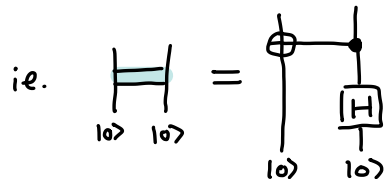
$$U = \begin{pmatrix} \frac{1}{\sqrt{2}} & \cdot & \cdot & \cdot \\ 0 & \cdot & \cdot & \cdot \\ 0 & \cdot & \cdot & \cdot \\ \frac{1}{\sqrt{2}} & \cdot & \cdot & \cdot \end{pmatrix}$$

$$A^{(N)\dagger} = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 \\ 0 \end{pmatrix}$$

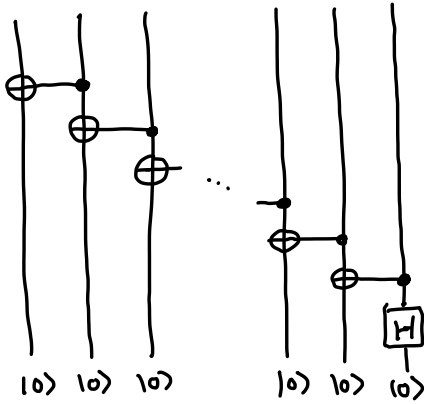
$$A^{(N)b} = \frac{1}{\sqrt{2}} \begin{pmatrix} 0 \\ 1 \end{pmatrix}$$

A unitary that works is

$$U = \frac{1}{\sqrt{2}} \begin{pmatrix} 1 & 1 & 0 & 0 \\ 0 & 0 & 1 & -1 \\ 0 & 0 & 1 & 1 \\ 1 & -1 & 0 & 0 \end{pmatrix} = \text{CNOT}_{21}(\mathbb{1} \otimes H)$$

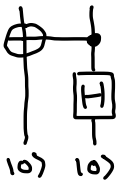


Finally we end up with the quantum circuit



We can easily check that this quantum circuit does indeed prepare the GHZ state.

In fact, our first Bell State circuit was a special case of this circuit with  $N=2$



# Why Quantum Circuits?

So why have we bothered making this connection between tensor networks and MPS?

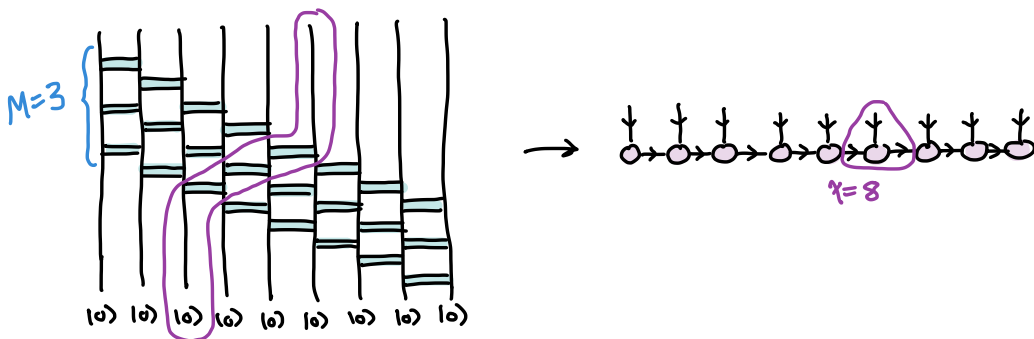
How can we use it?

One reason is that it is valuable to have a common language. It may allow us to take lessons learnt from MPS and TNS and apply them to quantum circuits, and vice versa.

However, there is a much more direct reason.

A quantum computer can perform certain tensor network contractions exponentially more efficiently than classical computers.

To see this, let's do the reverse of what we did previously and write down a quantum circuit and map back to MPS. Consider the following type of sequential circuit.



The circuit I have drawn is a subset of MPS with  $\chi=8$ .

More generally if I use  $M$  sequential layers, then this is a subset of MPS with  $\chi=2^M$ .

It has  $O(MN)$  number of parameters, whereas the  $\chi=2^M$  MPS has  $O(\chi^2 N) = O(4^M N)$  parameters.

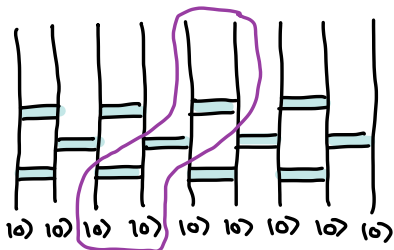
Nevertheless, as long as  $N > M$ , the cost of classically contracting this network scales with  $\chi=2^M$ .

However, on the quantum computer, we need  $N$  qubits and a runtime that is proportional to  $N+M$ . This is an exponential improvement!

This is a type of "sparse" quantum-MPS that can be efficiently contracted on a quantum computer.

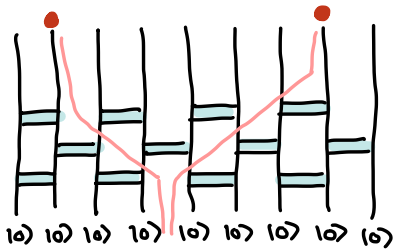
These states are physically relevant for non-equilibrium dynamics.

As a second example consider the shallow brickwall circuits. These are particularly efficient on quantum computers as they use nearest-neighbour 2-qubit gates and are fixed depth



Note this is actually a subset of sequential circuits!

By limiting the quantum computing time to  $O(M)$ , we have introduced an additional restriction on the state.



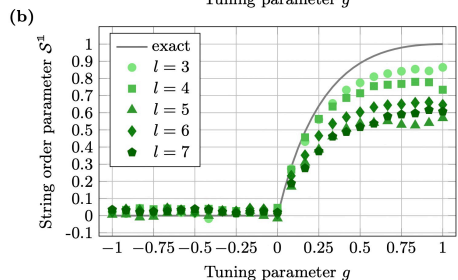
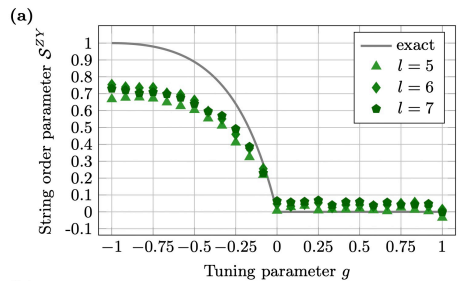
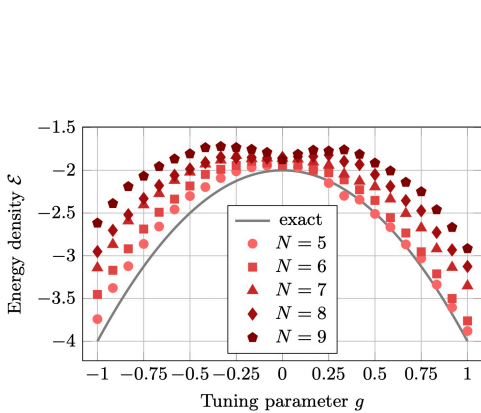
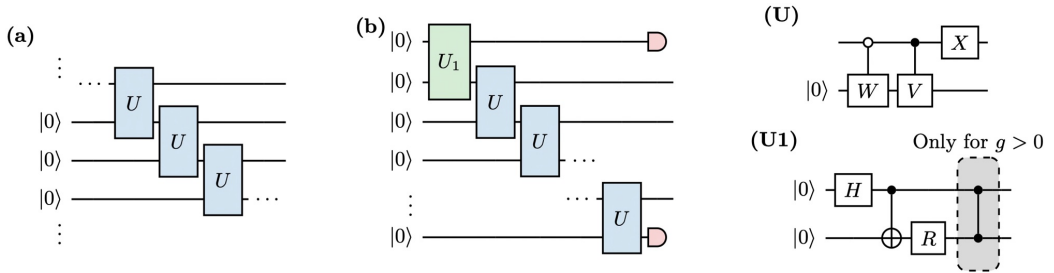
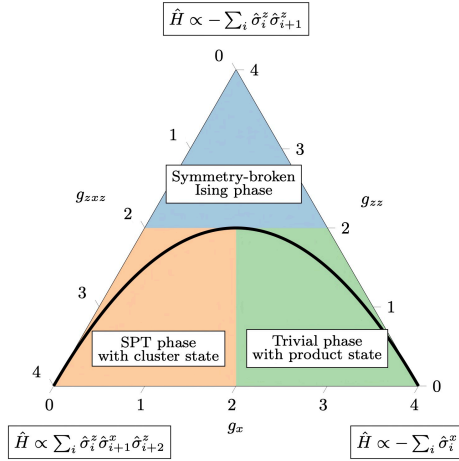
There are no correlations between the red qubits.

Since we start from a product state, correlations can build up only if the "backwards lightcones" overlap.

This type of circuit has a strict correlation length instead of the exponential decay of general MPS.

# Example: Crossing a topological phase transition

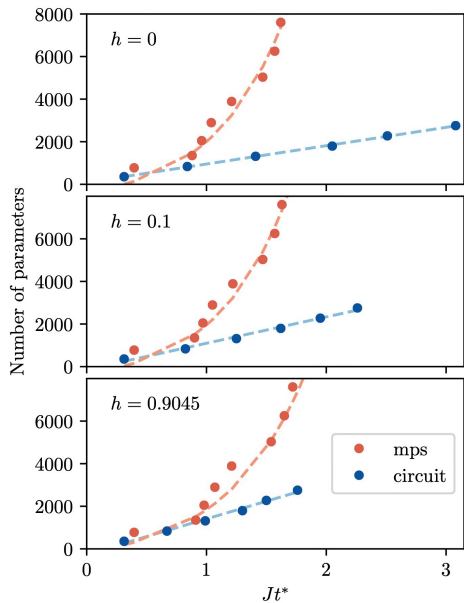
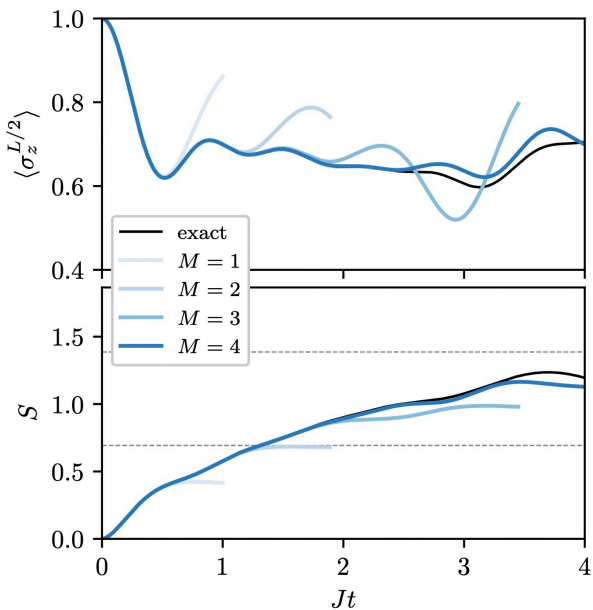
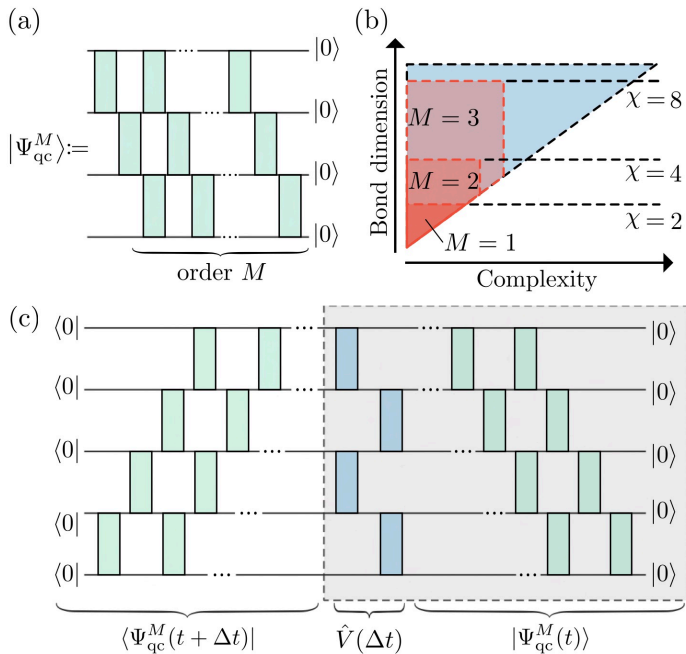
Adam Smith, Bernhard Jobst, Andrew G. Green, and Frank Pollmann [Phys. Rev. Research 4, L022020 (2022)]





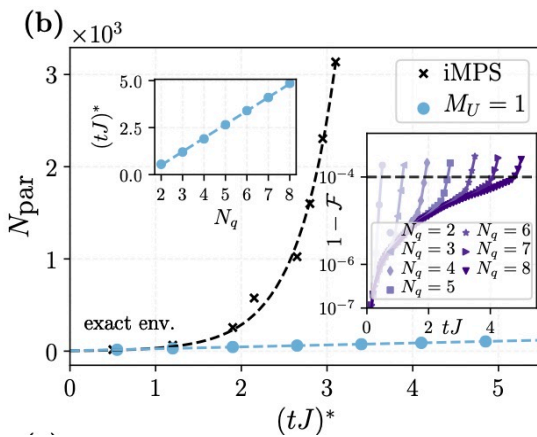
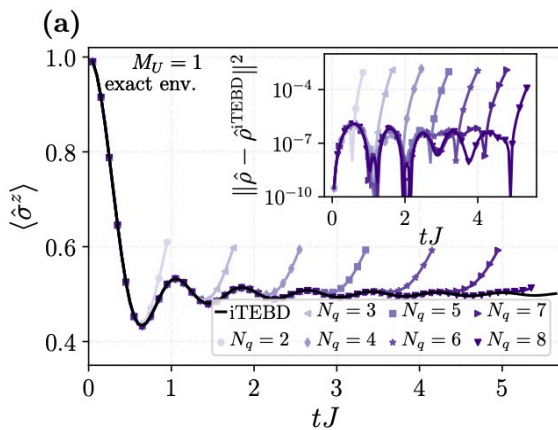
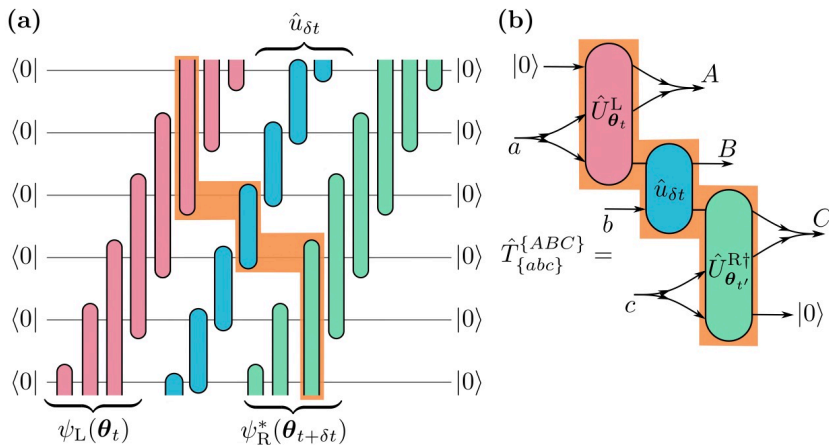
## Example: Quantum-TEBD

Sheng-Hsuan Lin, Rohit Dilip, Andrew G. Green, Adam Smith, Frank Pollmann [PRX Quantum 2, 010342 (2021)]



# Example: Infinite Quantum-TEBD

Nikita Astrakhantsev, Sheng-Hsuan Lin, Frank Pollmann, Adam Smith [arXiv:2210.03751]



# References

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## **Quantum version of TEBD**

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## **Quantum version of iTEBD**

Nikita Astrakhantsev, Sheng-Hsuan Lin, Frank Pollmann, Adam Smith [arXiv:2210.03751]

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Daniel Malz, Georgios Styliaris, Zhi-Yuan Wei, J. Ignacio Cirac [arXiv:2307.01696]

