

Title: PSI 2016/2017 Condensed Matter (Review) - Lecture 12

Date: Feb 15, 2017 09:00 AM

URL: <http://pirsa.org/17020048>

Abstract:

Condensed Matter Review – PSI 2016-2017

Lecture 18 (of 18)

Tensor Networks in

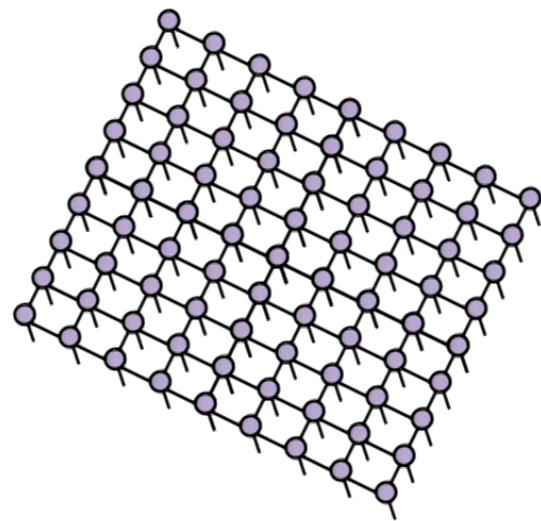
- (i) D>1 spatial dimensions
- (ii) Statistical Mechanics
(partition functions)
- (iii) Holography

Guifre Vidal, Perimeter Institute

(i) Tensor Networks in D>1 spatial dimensions

area law

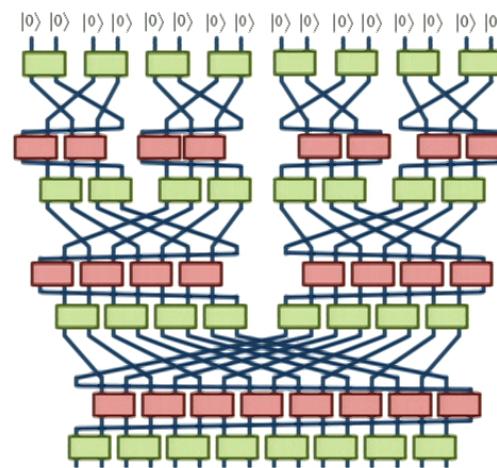
$$S(L) = L^{D-1}$$



projected entangled pair states
(PEPS)

logarithmic correction

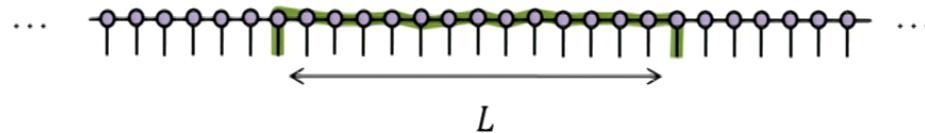
$$S(L) = L^{D-1} \log(L)$$



branching MERA

CORRELATIONS and DISTANCE

matrix product state (MPS)

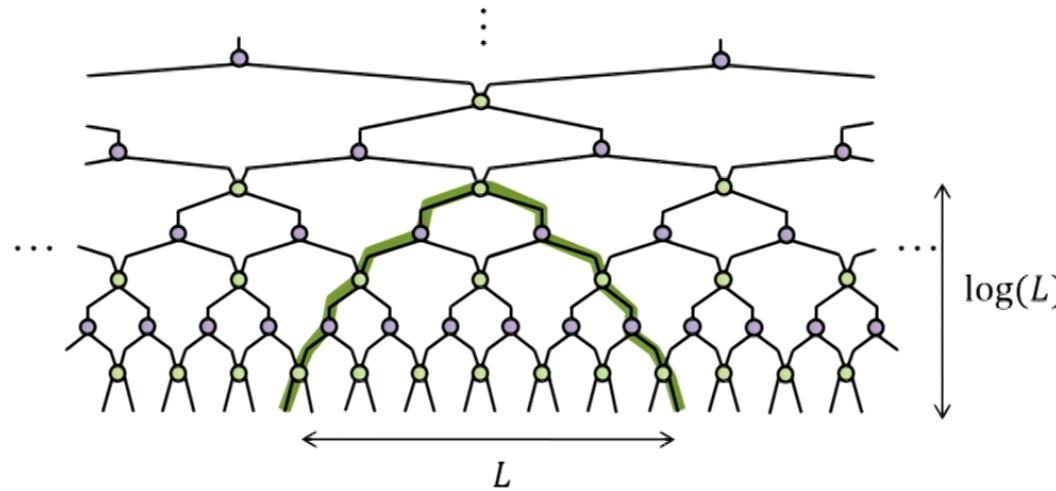


exponential correlators

$$C(L) \approx e^{-L/\xi}$$

$$[C(L) \approx \lambda^L]$$

multi-scale entanglement renormalization ansatz (MERA)



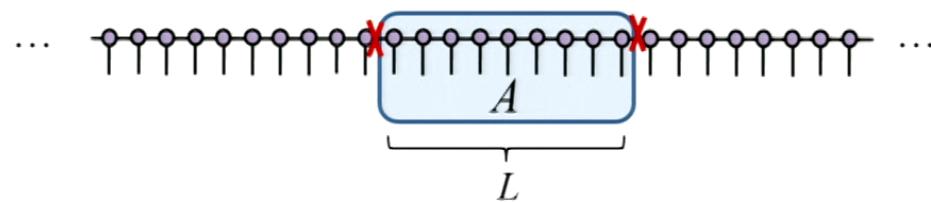
polynomial correlators

$$C(L) \approx L^{-p}$$

$$[C(L) \approx \lambda^{\log(L)}]$$

ENTANGLEMENT ENTROPY and CONNECTIVITY

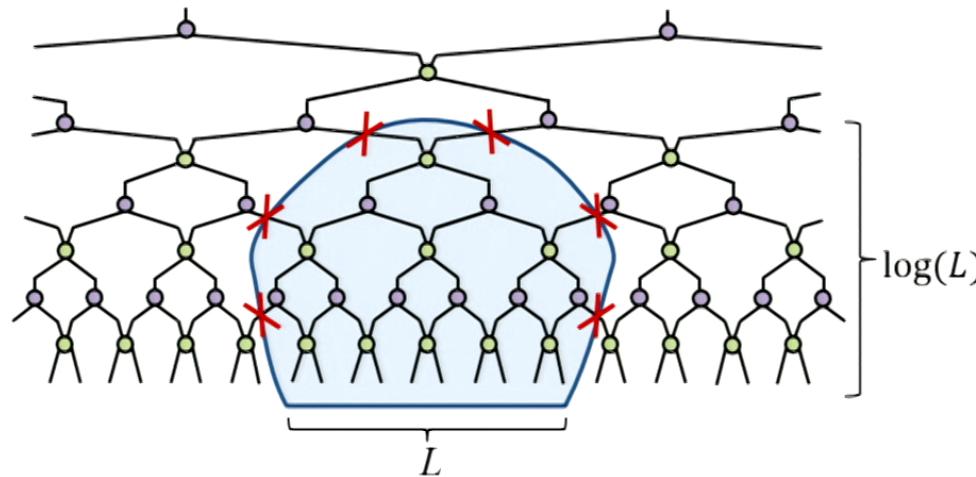
matrix product state (MPS)



constant entropy

$$S_L \approx \text{const}$$

multi-scale entanglement renormalization ansatz (MERA)

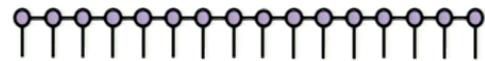


logarithmic entropy

$$S_L \approx \log(L)$$

D=1 spatial dimensions

matrix product state
(MPS)

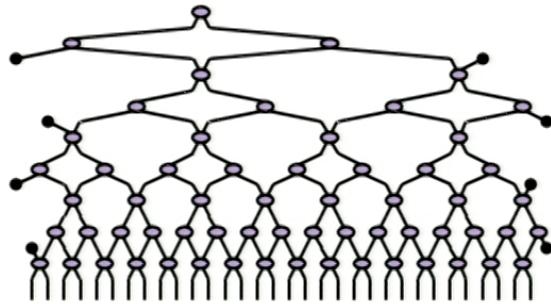


$$C(L) \approx e^{-L/\xi}$$

$$S_L \approx \text{const } (= L^{D-1})$$

(gapped systems)

multi-scale entanglement renormalization ansatz
(MERA)



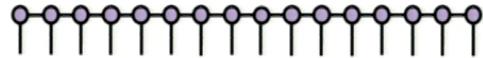
$$C(L) \approx L^{-p}$$

$$S_L \approx \log L \quad (= L^{D-1} \log L)$$

(critical systems)

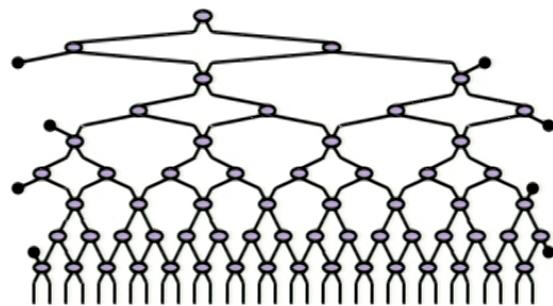
D=1 spatial dimensions

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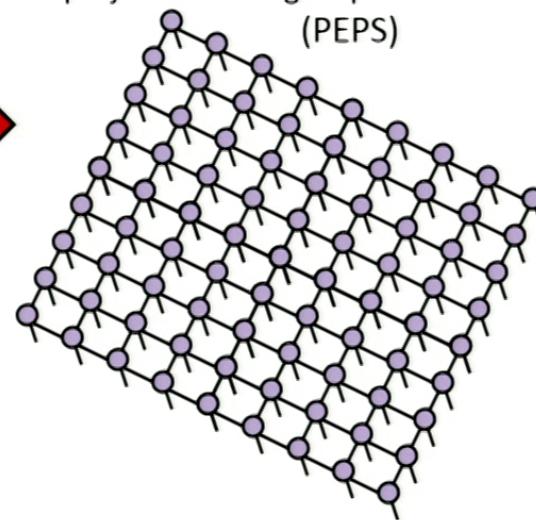


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(critical systems)

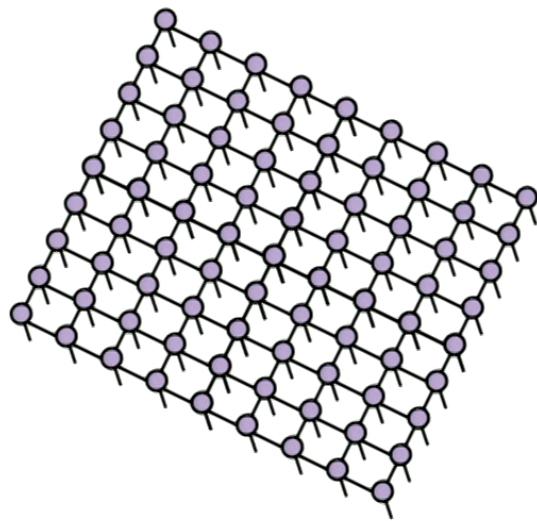
D=2 spatial dimensions

projected entangled pair states
(PEPS)



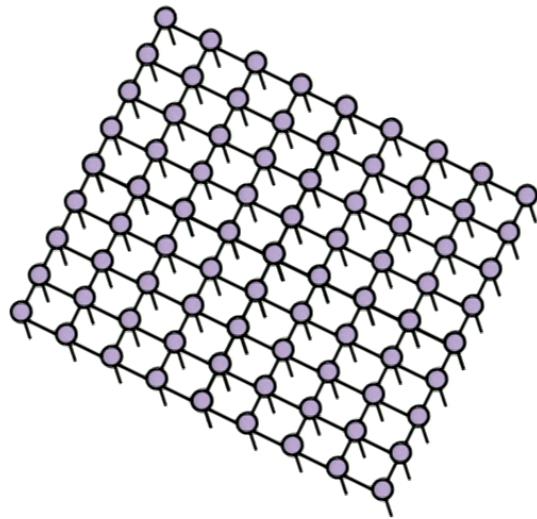
Projected entangled pair states (PEPS)

A - Efficient representation?

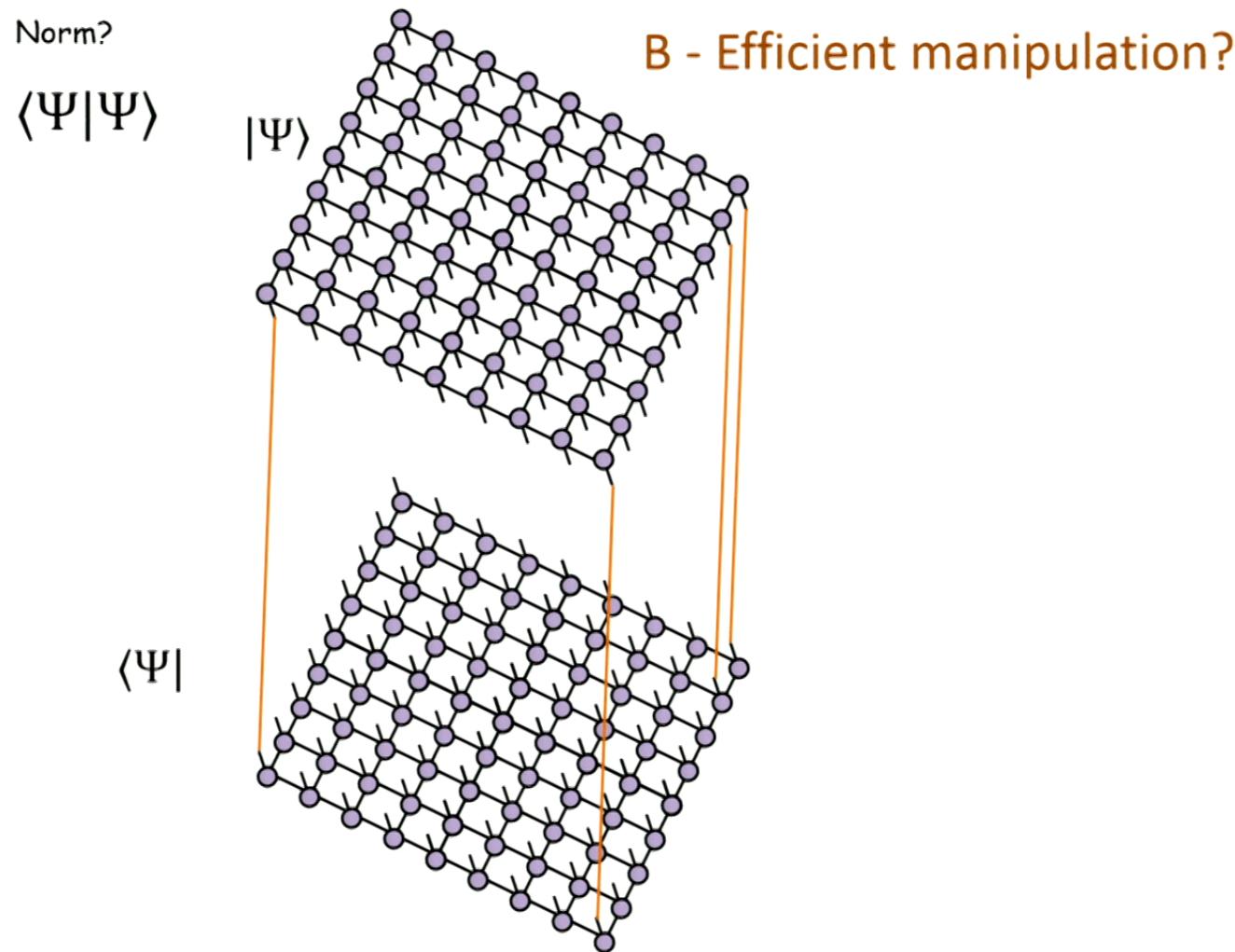


Projected entangled pair states (PEPS)

A - Efficient representation?



Projected entangled pair states (PEPS)

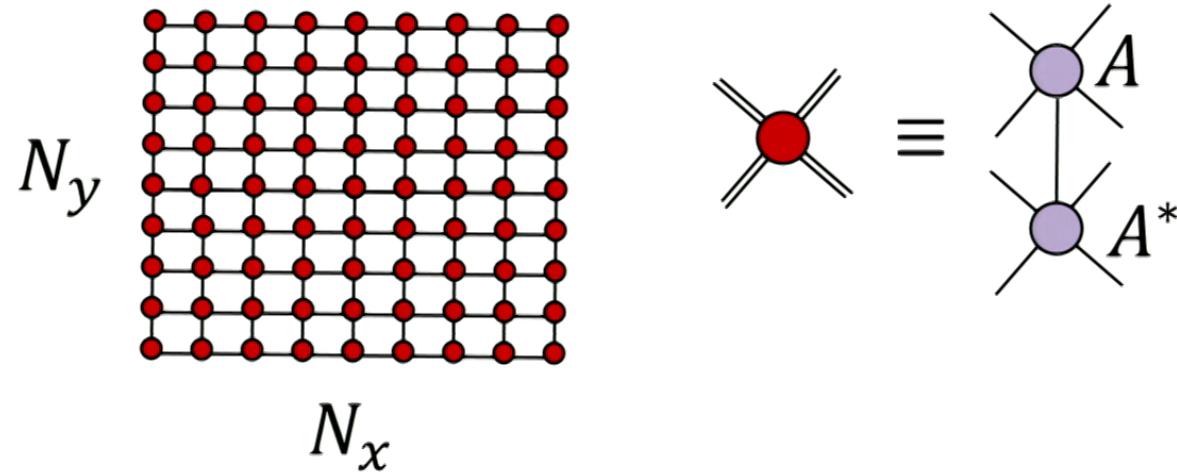


Projected entangled pair states (PEPS)

Norm?

$$\langle \Psi | \Psi \rangle$$

B - Efficient manipulation?

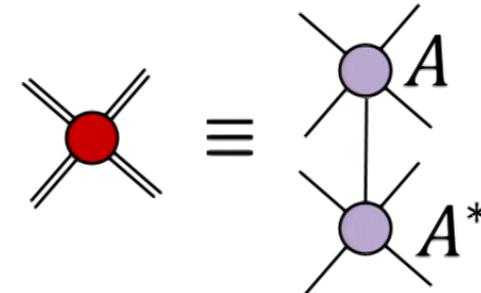
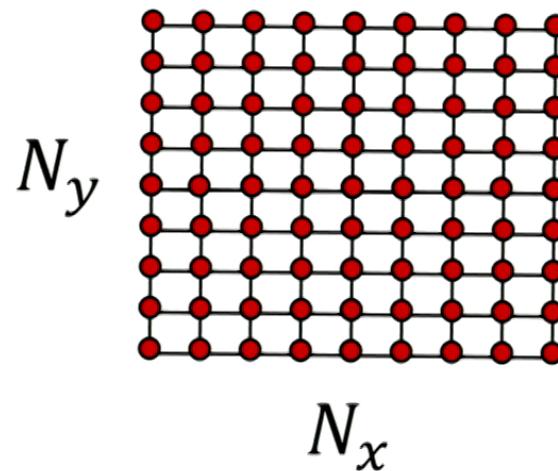


Projected entangled pair states (PEPS)

Norm?

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B - Efficient manipulation?

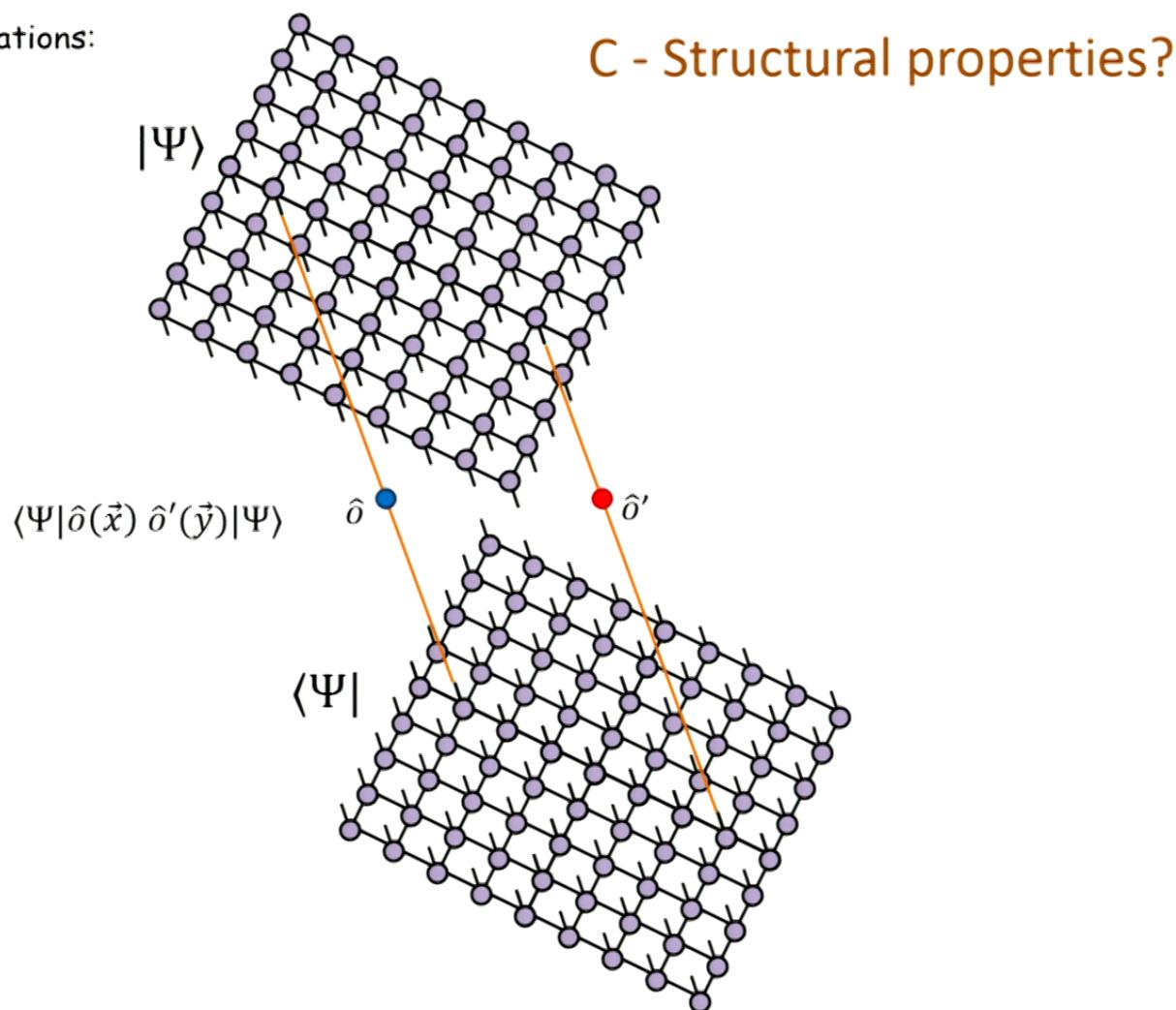


Cost exact
contraction

$$N_x \exp(N_y) \quad (\text{if } N_y < N_x)$$

Projected entangled pair states (PEPS)

Correlations:

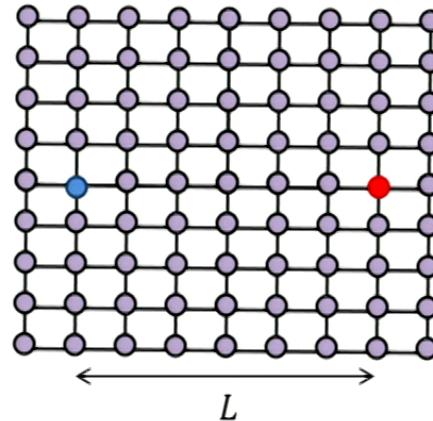


Projected entangled pair states (PEPS)

Correlations:

$$\langle \Psi | \hat{o}(\vec{x}) \hat{o}'(\vec{y}) | \Psi \rangle$$

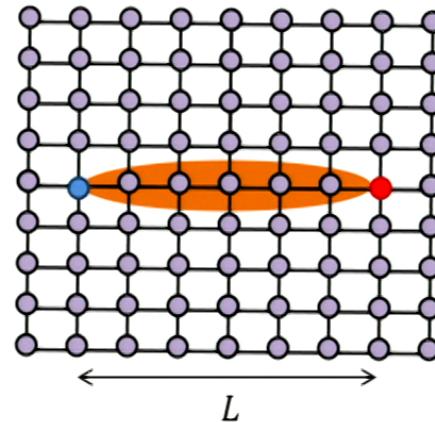
C - Structural properties?



Projected entangled pair states (PEPS)

Correlations:

$$\langle \Psi | \hat{o}(\vec{x}) \hat{o}'(\vec{y}) | \Psi \rangle$$



C - Structural properties?

exponential correlations

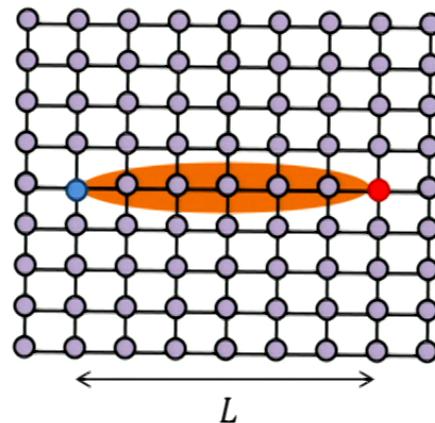
$$C(L) \approx e^{-L/\xi}$$

(generic)

Projected entangled pair states (PEPS)

Correlations:

$$\langle \Psi | \hat{o}(\vec{x}) \hat{o}'(\vec{y}) | \Psi \rangle$$

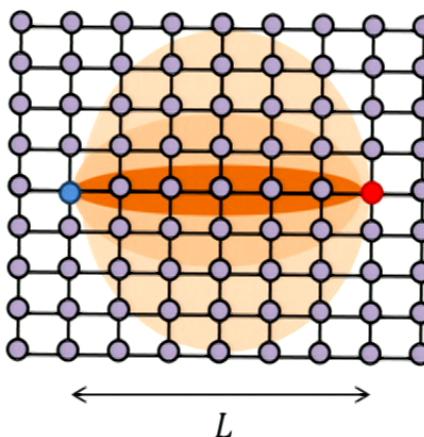


C - Structural properties?

exponential correlations

$$C(L) \approx e^{-L/\xi}$$

(generic)



polynomial correlations

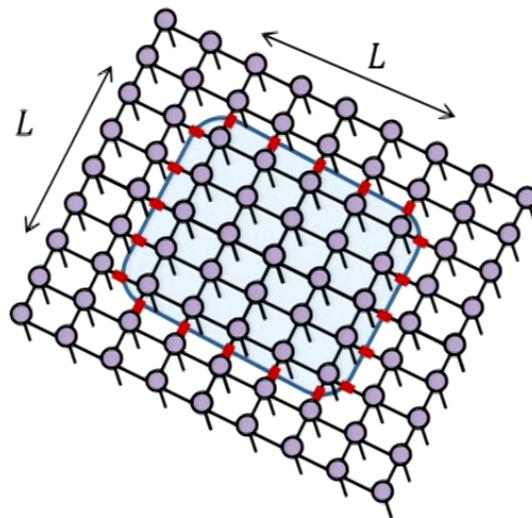
$$C(L) \approx L^{-p}$$

(fine-tuned)

Projected entangled pair states (PEPS)

Entanglement entropy:

C - Structural properties?



area law for entanglement entropy

$$S_L \leq 4L \log (\chi) \quad (= L^{D-1})$$

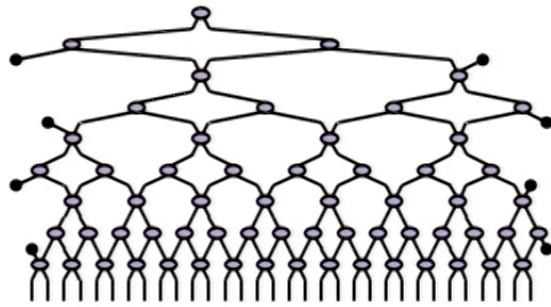
D=1 spatial dimensions

matrix product state
(MPS)

$$C(L) \approx e^{-L/\xi}$$
$$S_L \approx \text{const } (= L^{D-1})$$

(gapped systems)

multi-scale entanglement renormalization ansatz
(MERA)

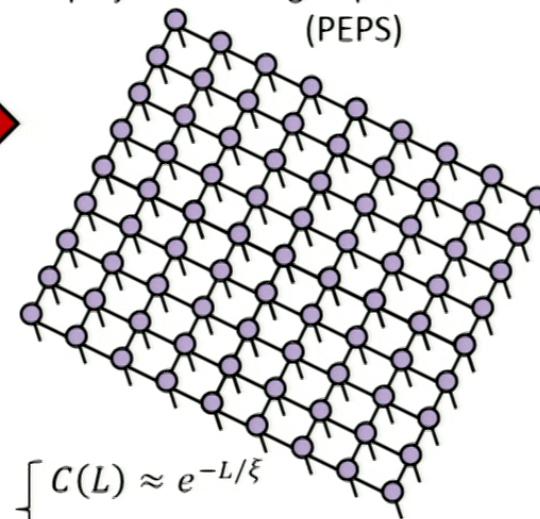


$$C(L) \approx L^{-p}$$
$$S_L \approx \log L \quad (= L^{D-1} \log L)$$

(critical systems)

D=2 spatial dimensions

projected entangled pair states
(PEPS)



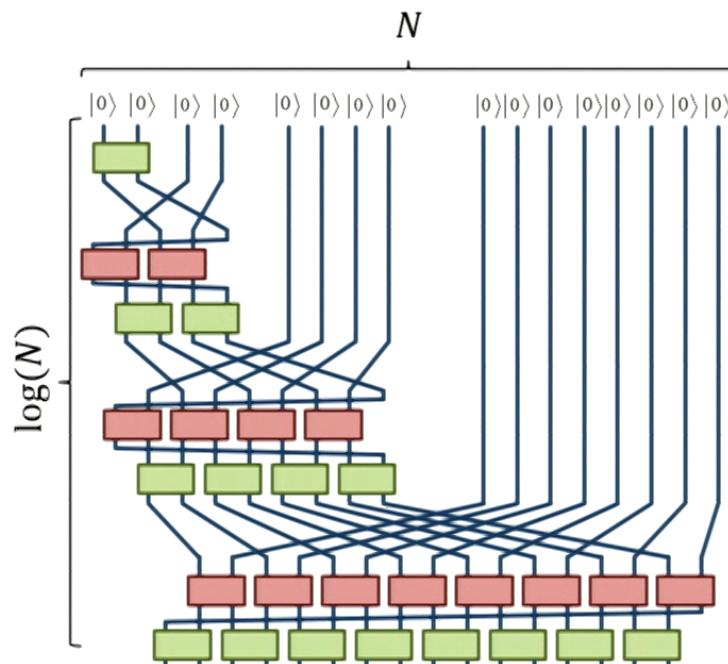
$$\begin{cases} C(L) \approx e^{-L/\xi} \\ C(L) \approx L^{-p} \end{cases}$$
$$S_L \approx L \quad (= L^{D-1})$$

2D MERA

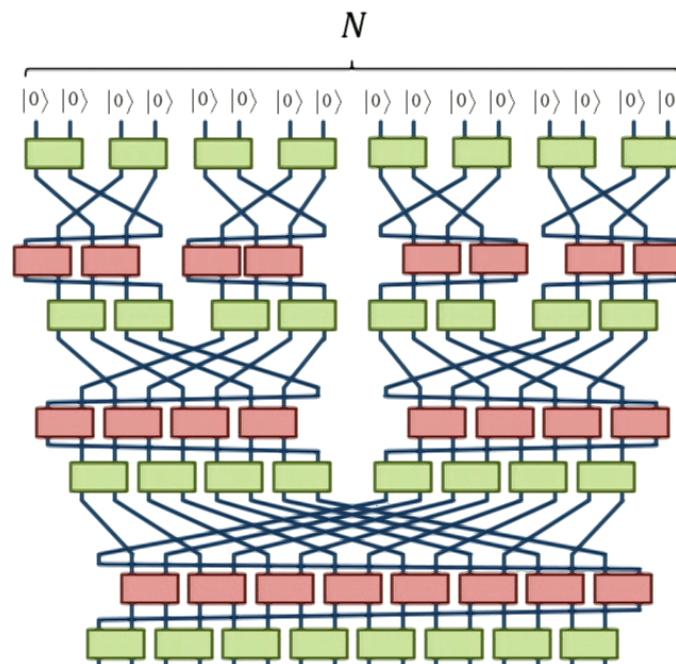
$$C(L) \approx L^{-p}$$
$$S_L \approx L \quad (= L^{D-1})$$

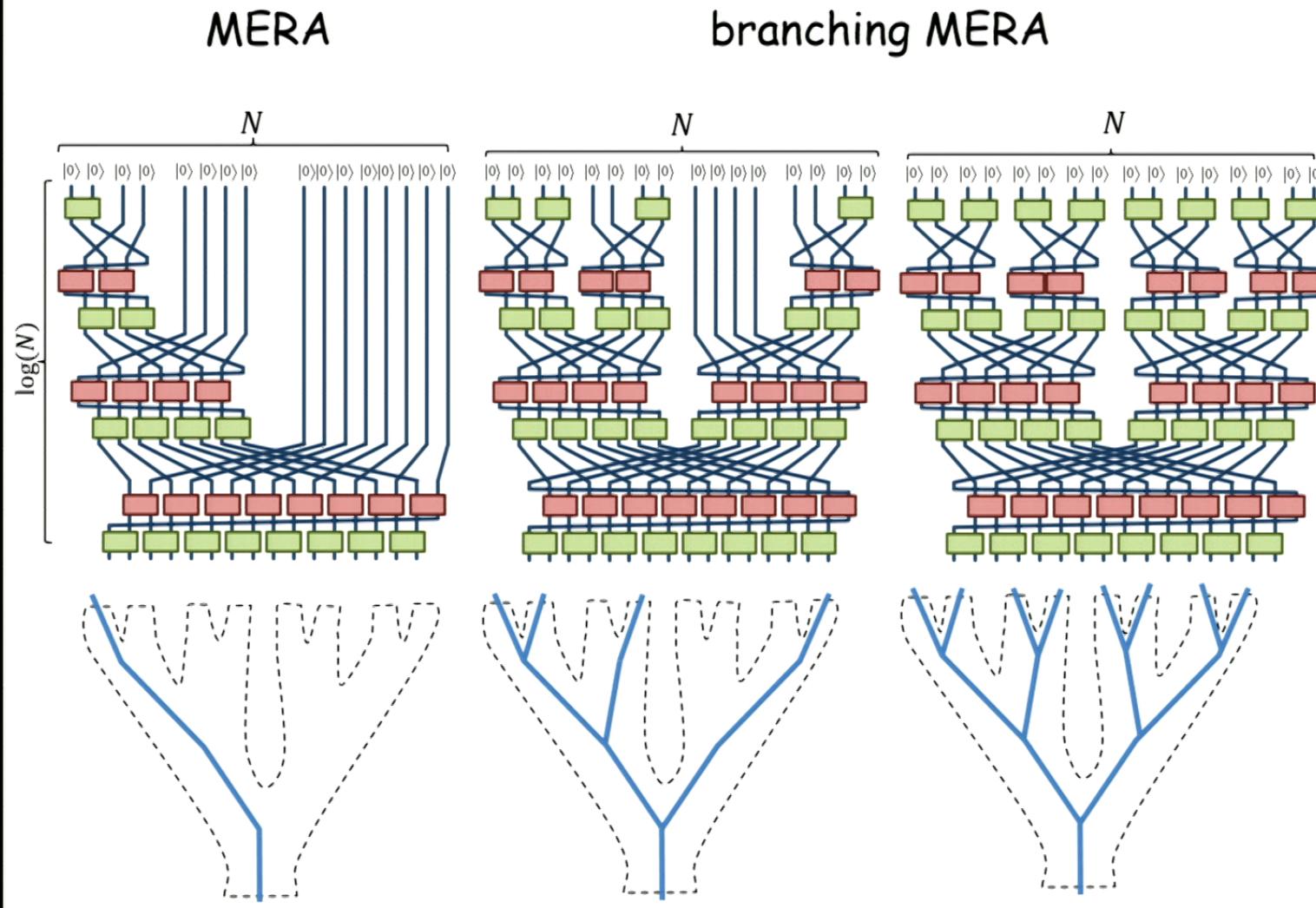
Branching MERA

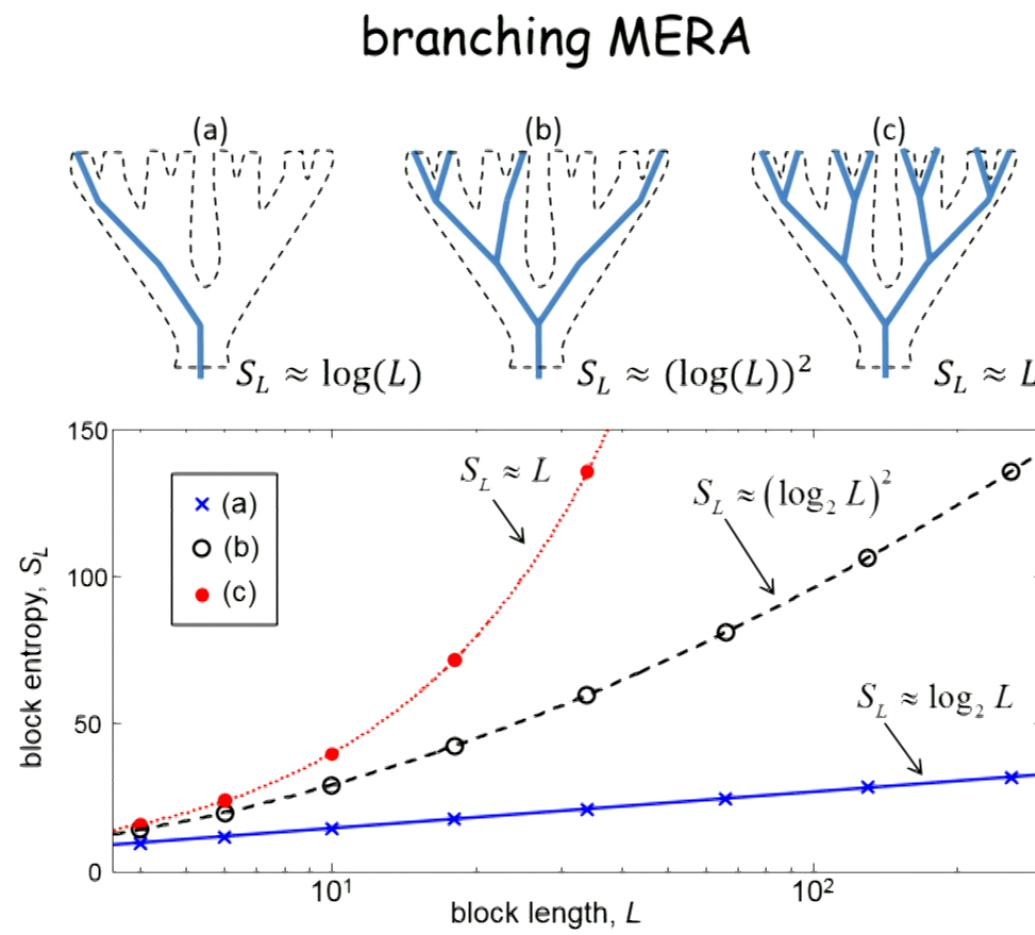
MERA



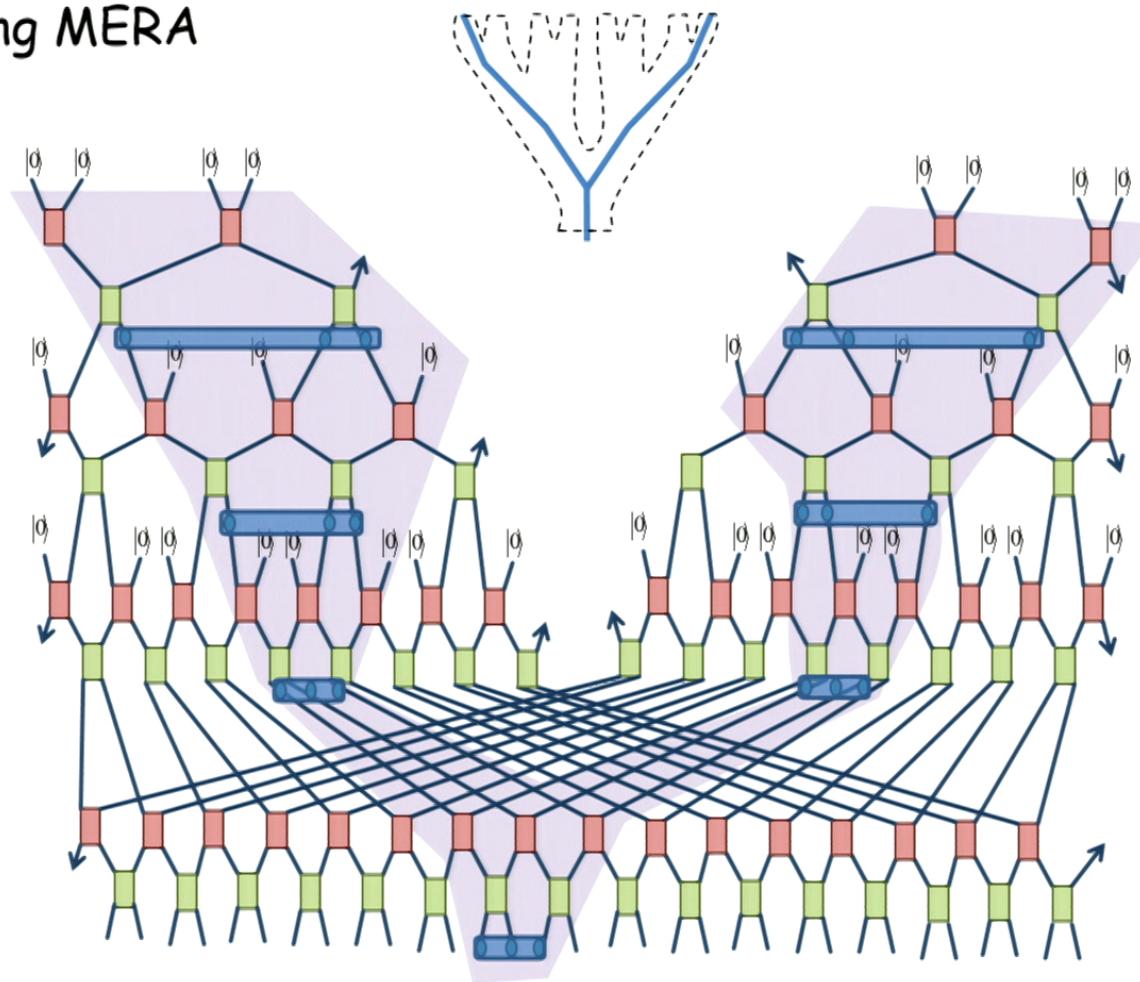
branching MERA







branching MERA



$$S_L \approx \log(L) + \log(L)$$

branching MERA



D=1 spatial dimensions

$$S_L \approx \log(L)$$

...

$$S_L \approx L$$

D>1 spatial dimensions

$$S_L \approx L^{D-1} \quad \dots \quad S_L \approx L^{D-1} \log(L) \quad \dots \quad S_L \approx L^D$$

Scaling of entanglement entropy (second week)

Dimension	gapped $\Delta > 0$	gapless no (D-1)- dimensional Fermi surface	$\Delta = 0$ (D-1)- dimensional Fermi surface
D=1 	$S_L \approx \text{const}$	N/A	$S_L \approx \log(L)$
D=2 	$S_L \approx L$	$S_L \approx L$	$S_L \approx L \log(L)$
D=3 	$S_L \approx L^2$	$S_L \approx L^2$	$S_L \approx L^2 \log(L)$

{

$$S_L \approx L^{D-1}$$

area law

$$S_L \approx L^{D-1} \log(L)$$

area law
with logarithmic
correction

Summary/outlook

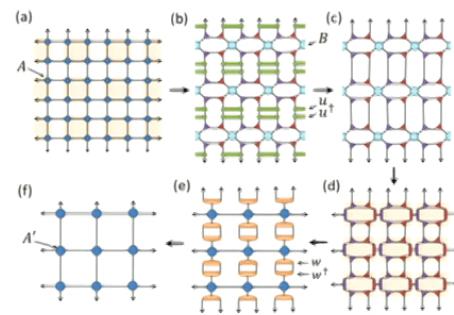
Tensor networks ([third week](#))

Dimension	gapped $\Delta > 0$	gapless no (D-1)- dimensional Fermi surface	$\Delta = 0$ (D-1)- dimensional Fermi surface
D=1 	$S_L \approx \text{const}$ MPS	N/A	$S_L \approx \log(L)$ MERA
D=2 	$S_L \approx L$ PEPS	$S_L \approx L$ MERA	$S_L \approx L \log(L)$
D=3 	$S_L \approx L^2$ PEPS	$S_L \approx L^2$ MERA	$S_L \approx L^2 \log(L)$

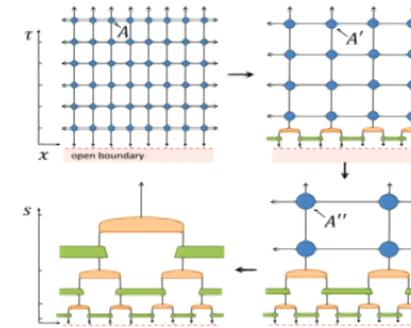
$S_L \approx L^{D-1}$
 area law $S_L \approx L^{D-1} \log(L)$
 area law
 with logarithmic
 correction

(ii) Tensor Networks in Statistical Mechanics (partition functions)

RG for statistical
partition functions

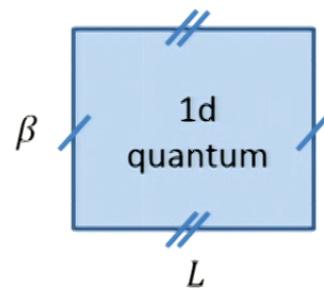


MERA from
Euclidean path integral



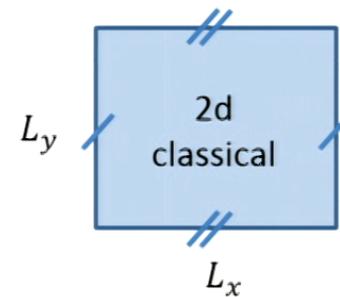
Euclidean path integral

$$Z(\lambda) = \text{tr } e^{-\beta H_q^{1d}}$$



Statistical partition function

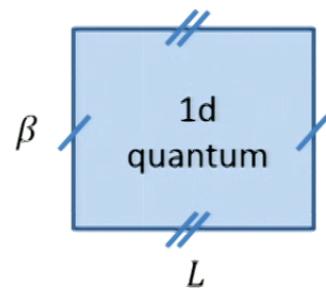
$$Z(T) = \sum_{\{s\}} e^{-\frac{1}{T} H_{cl}^{2d}}$$



\sim

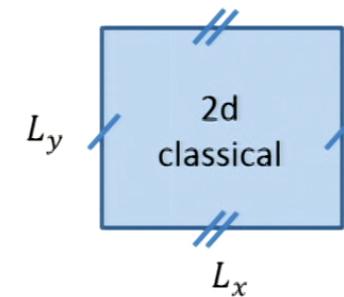
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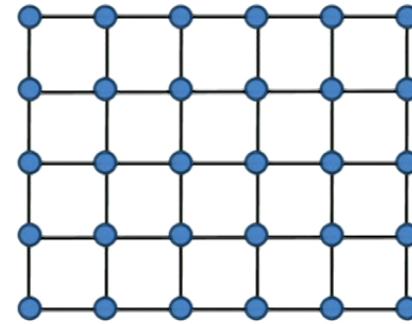
Statistical partition function

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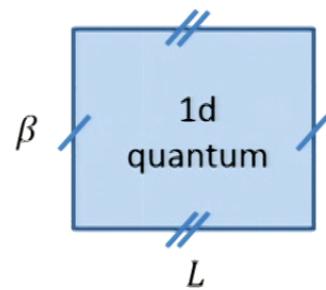
as a tensor network

$$Z =$$



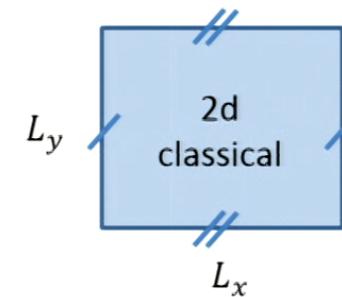
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$$Z(\lambda) = \text{tr } e^{-\beta H_q^{1d}}$$

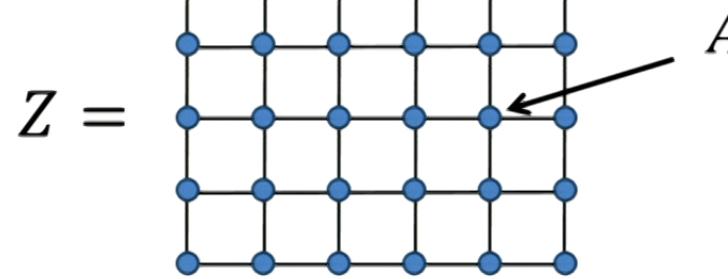


Statistical partition function

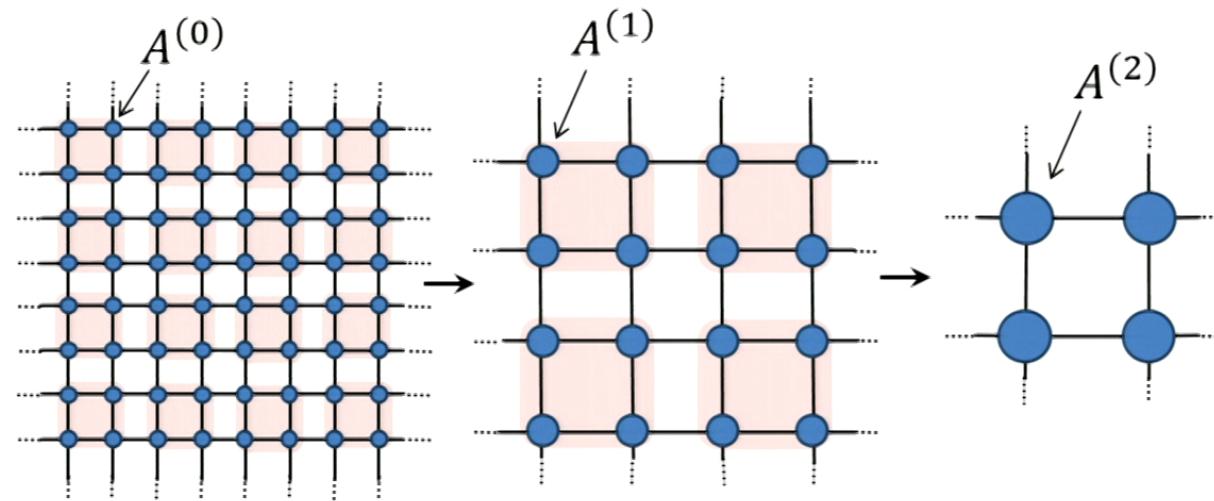
$$Z(T) = \sum_{\{s\}} e^{-\frac{1}{T} H_{cl}^{2d}}$$



as a tensor network

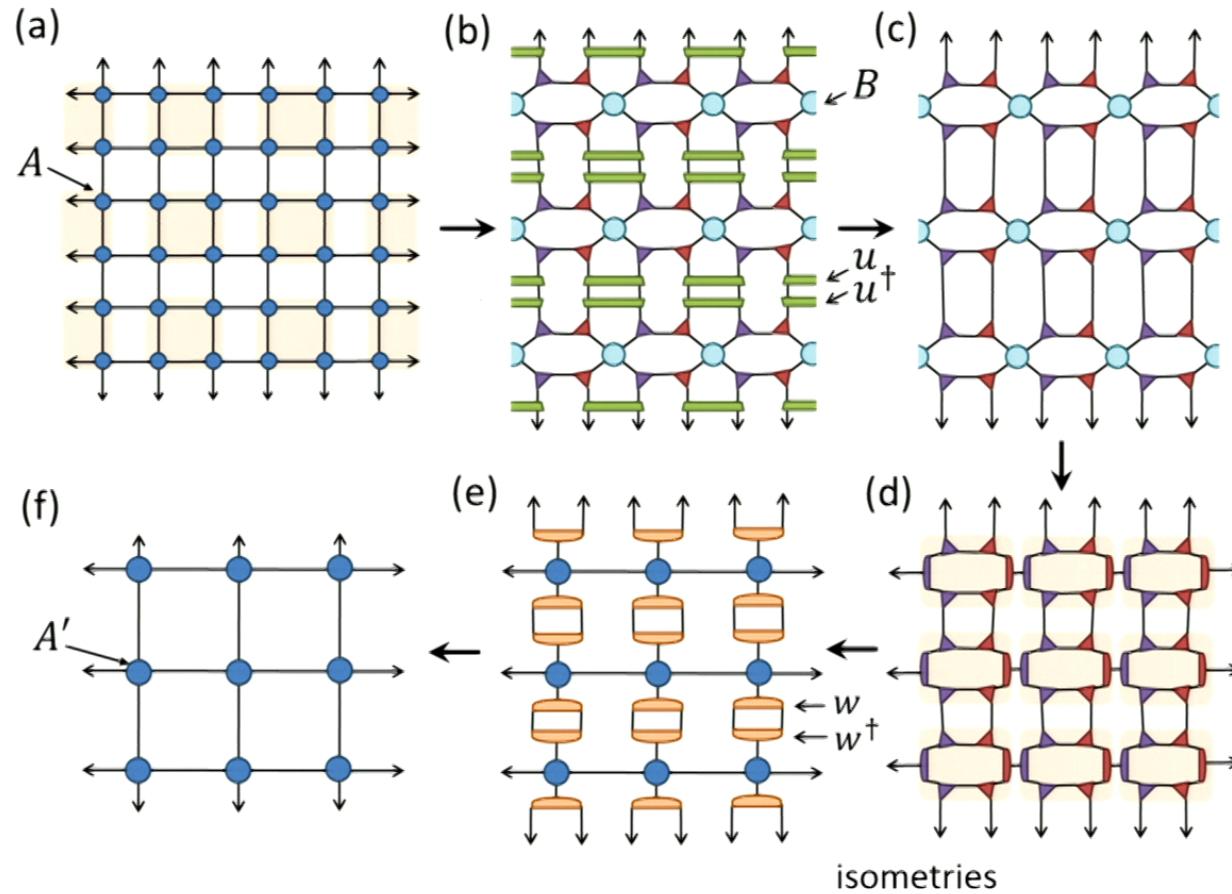


Goal: define an RG flow in the space of tensor networks



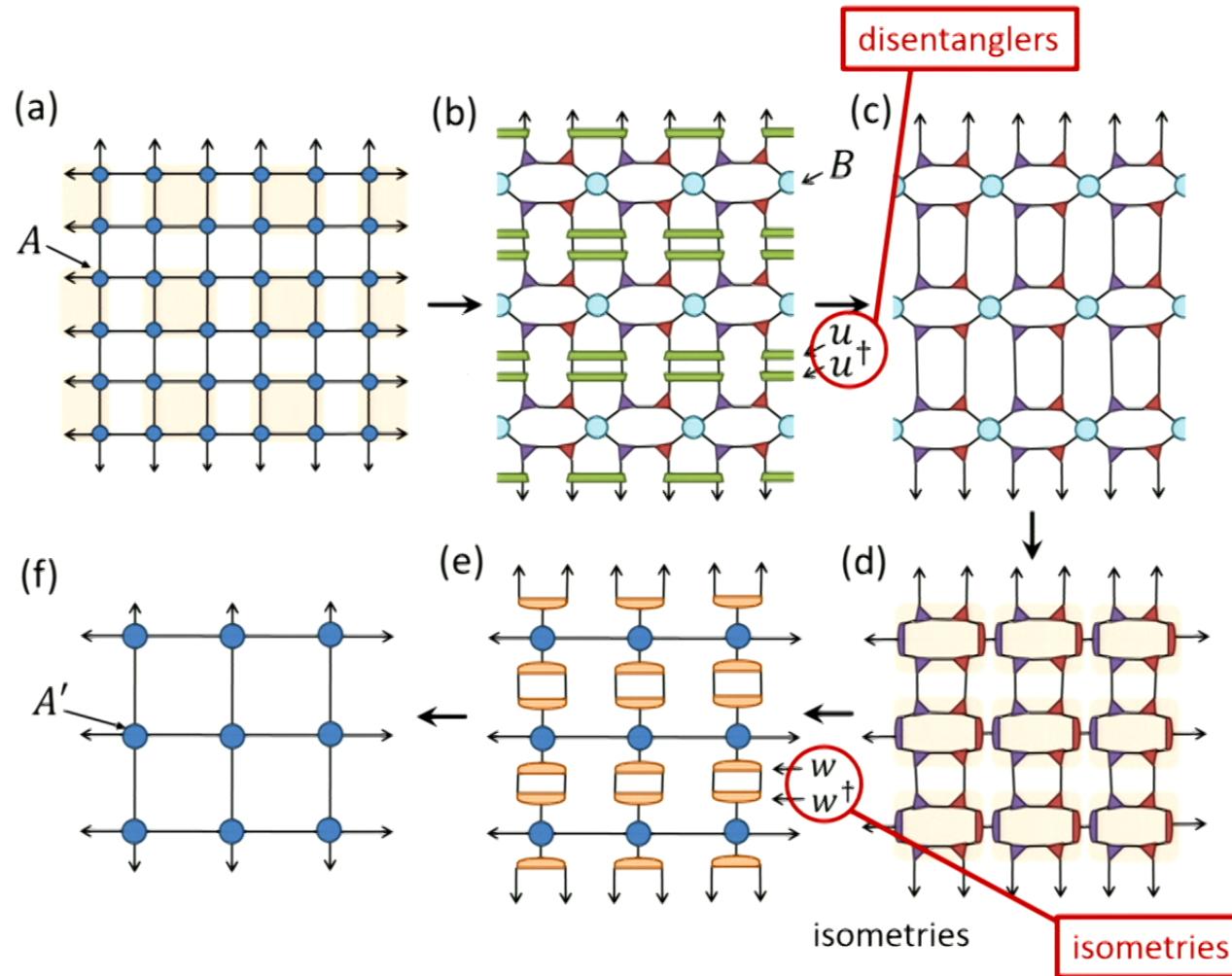
Tensor Network Renormalization (TNR)

[with Glen Evenbly, 2015 !]

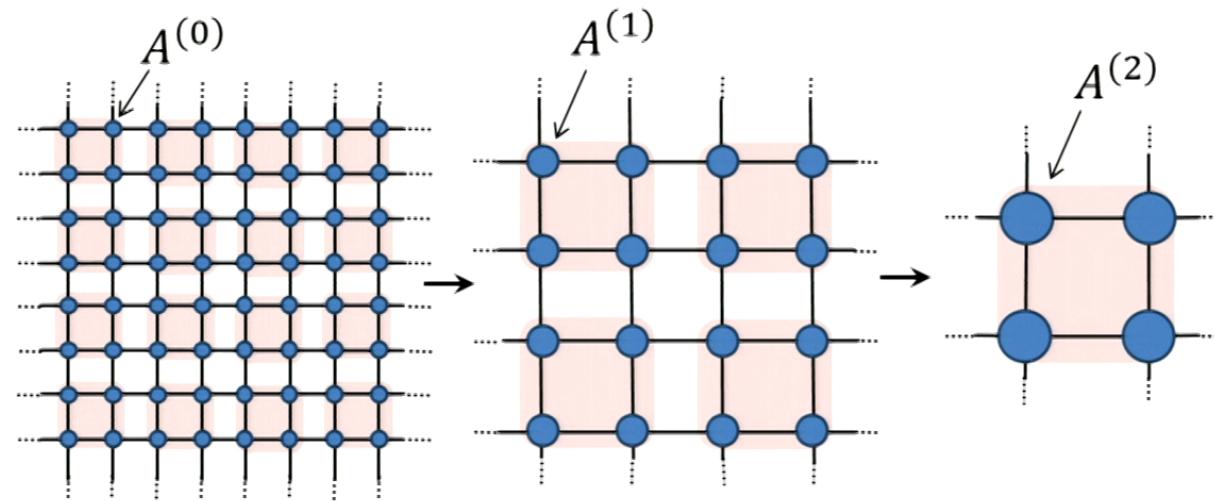


Tensor Network Renormalization (TNR)

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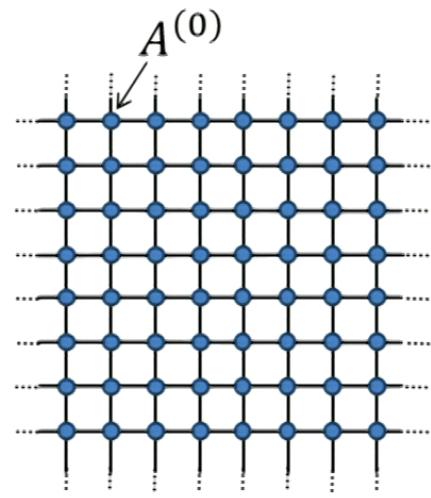


Goal: define an RG flow in the space of tensor networks



Many proposals, including
Tensor Renormalization Group (TRG) Levin-Nave, 2006

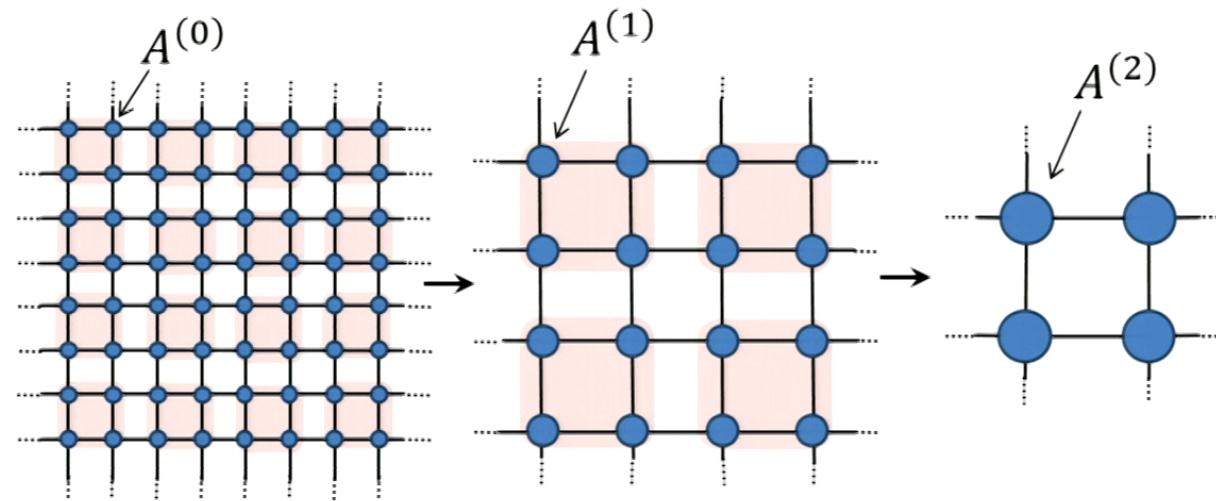
Net result: RG flow in the space of tensor networks



$$A^{(0)} \rightarrow A^{(1)} \rightarrow A^{(2)} \rightarrow \dots \rightarrow A^{fp}$$

Universal information of
the phase or phase transition

Net result: RG flow in the space of tensor networks



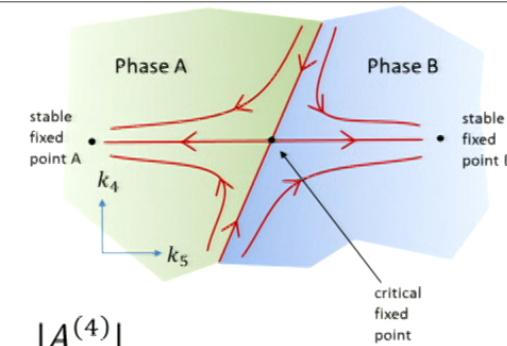
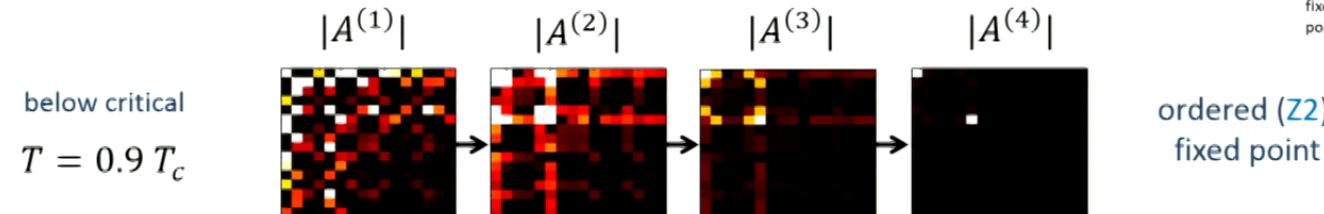
$$A^{(0)} \rightarrow A^{(1)} \rightarrow A^{(2)} \rightarrow \dots \rightarrow A^{fp}$$

Universal information of
the phase or phase transition

TNR -> proper RG flow

Example: 2D classical Ising

$$A^{(0)} \rightarrow A^{(1)} \rightarrow A^{(2)} \rightarrow \dots \rightarrow A^{fp}$$

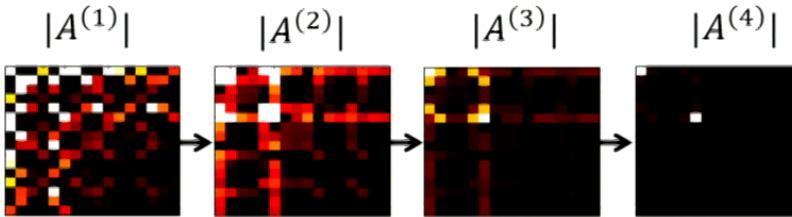


TNR -> proper RG flow

Example: 2D classical Ising

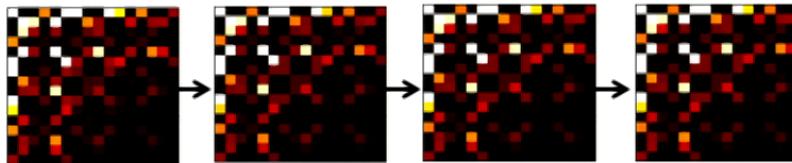
$$A^{(0)} \rightarrow A^{(1)} \rightarrow A^{(2)} \rightarrow \dots \rightarrow A^{fp}$$

below critical
 $T = 0.9 T_c$

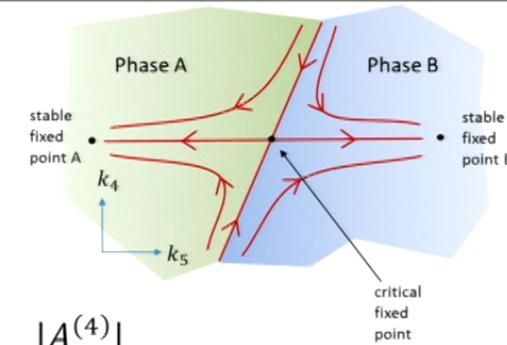


ordered (\mathbb{Z}_2)
fixed point

critical
 $T = T_c$



critical
fixed point

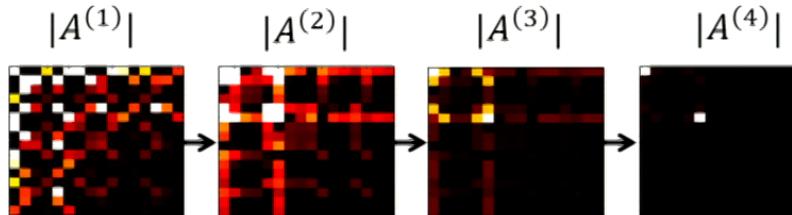


TNR -> proper RG flow

Example: 2D classical Ising

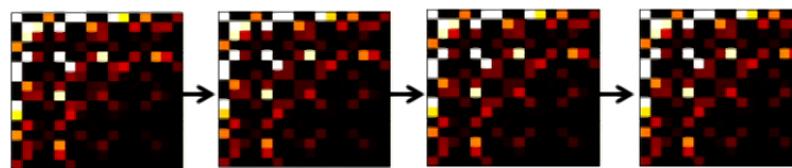
$$A^{(0)} \rightarrow A^{(1)} \rightarrow A^{(2)} \rightarrow \dots \rightarrow A^{fp}$$

below critical
 $T = 0.9 T_c$



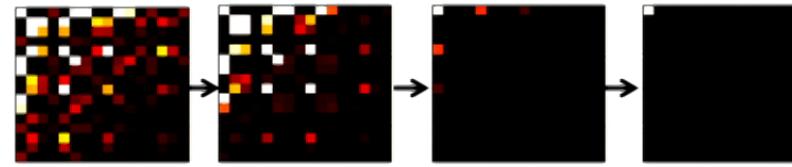
ordered (\mathbb{Z}_2)
fixed point

critical
 $T = T_c$

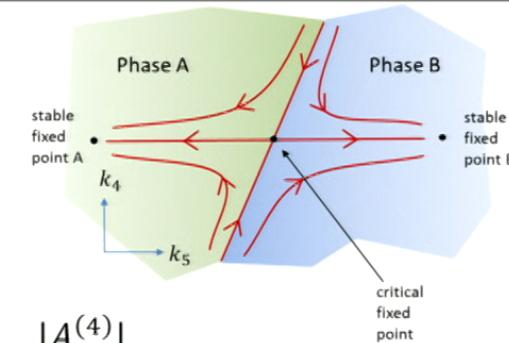


critical
fixed point

above critical
 $T = 1.1 T_c$

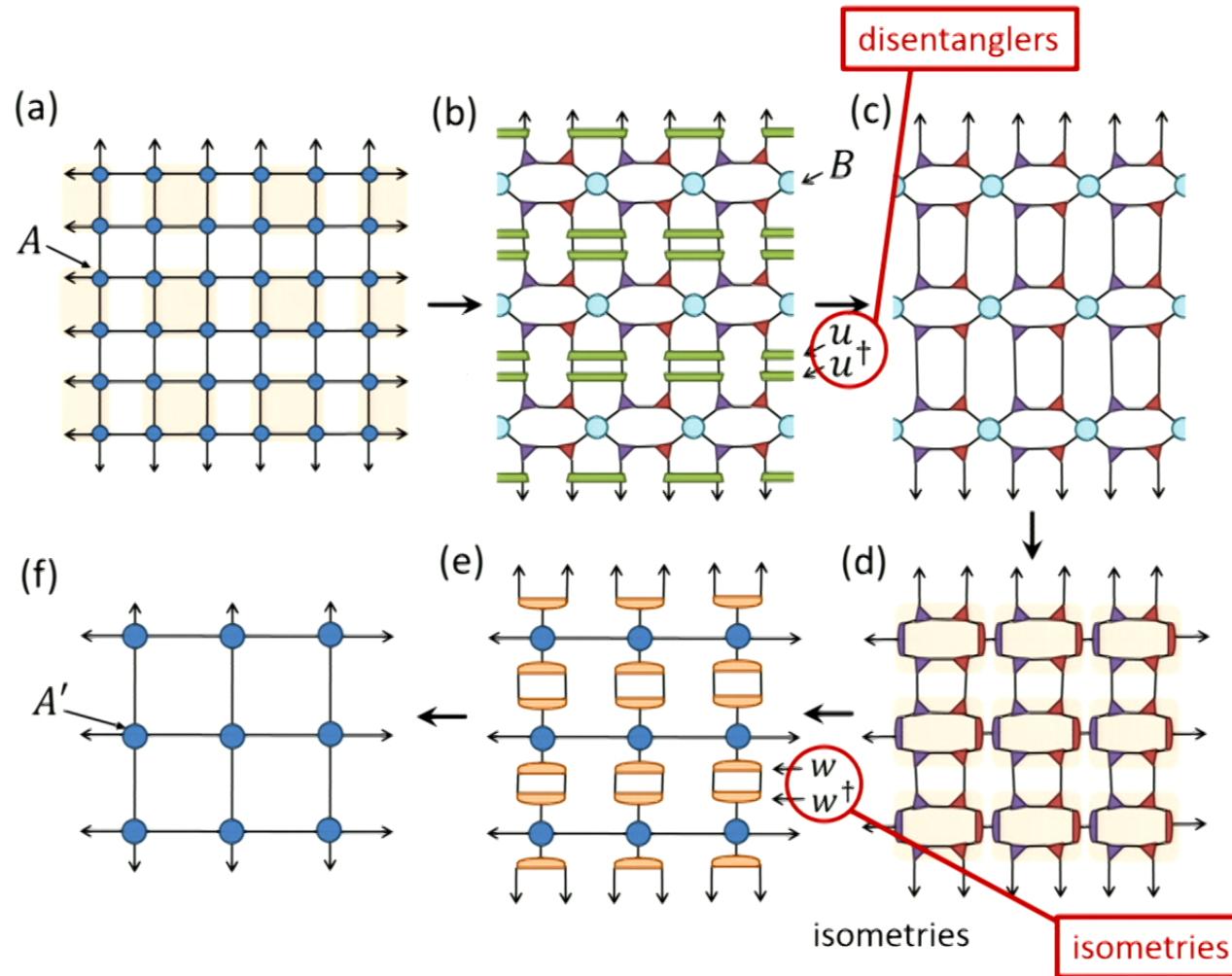


disordered
(trivial)
fixed point



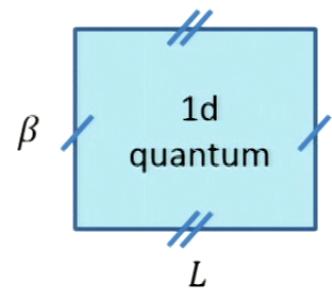
Tensor Network Renormalization (TNR)

[with Glen Evenbly, 2015 !]



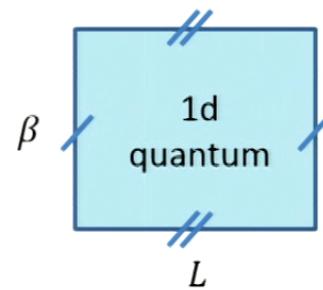
Euclidean path integral

$$Z(\lambda) = \text{tr } e^{-\beta H_q^{1d}}$$

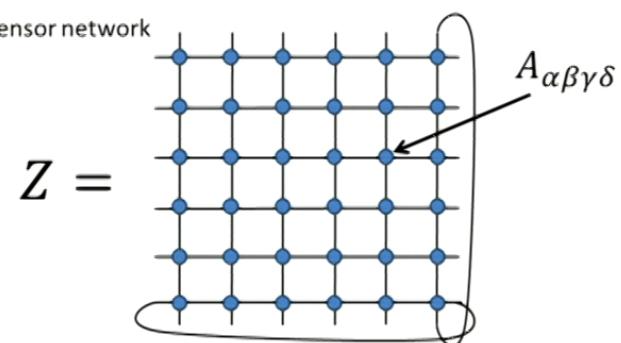


Euclidean path integral

$$Z(\lambda) = \text{tr } e^{-\beta H_q^{1d}}$$

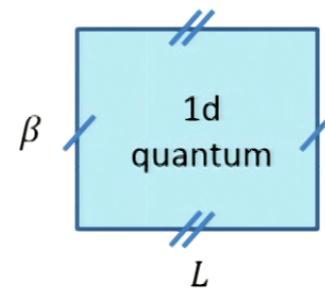


as a tensor network

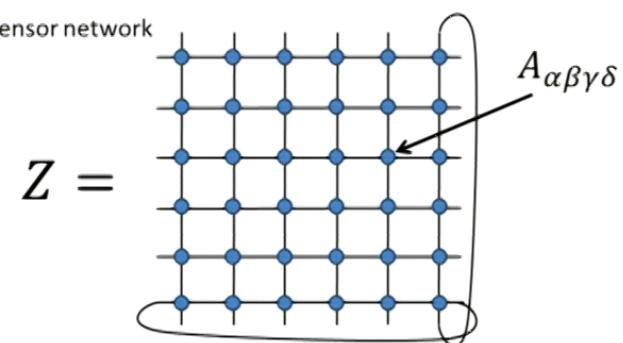


Euclidean path integral

$$Z(\lambda) = \text{tr } e^{-\beta H_q^{1d}}$$



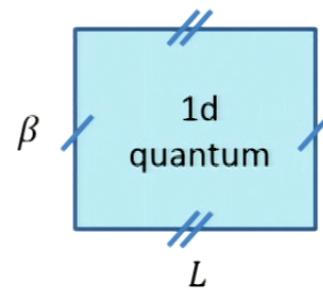
as a tensor network



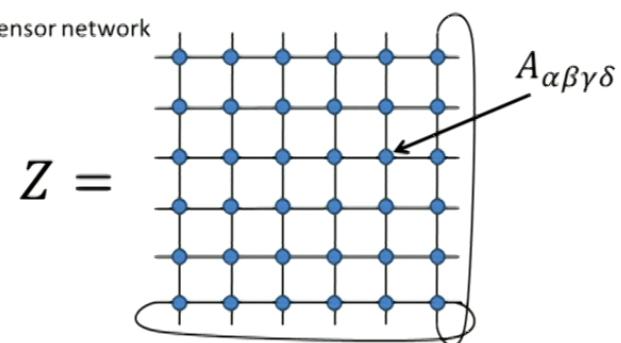
Euclidean time evolution on different geometries

Euclidean path integral

$$Z(\lambda) = \text{tr } e^{-\beta H_q^{1d}}$$

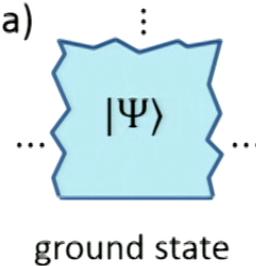


as a tensor network



Euclidean time evolution on different geometries

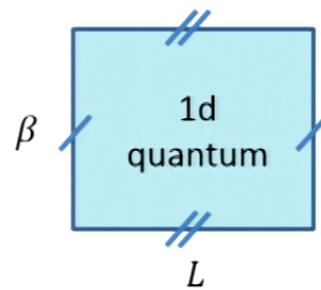
(a)



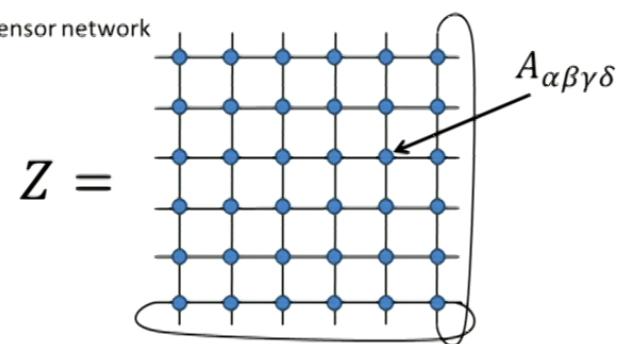
ground state

Euclidean path integral

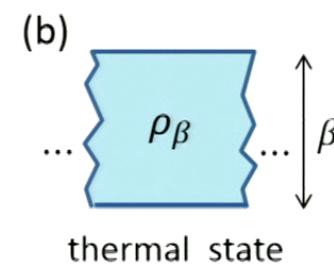
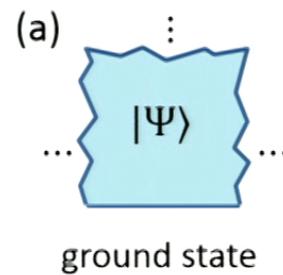
$$Z(\lambda) = \text{tr } e^{-\beta H_q^{1d}}$$



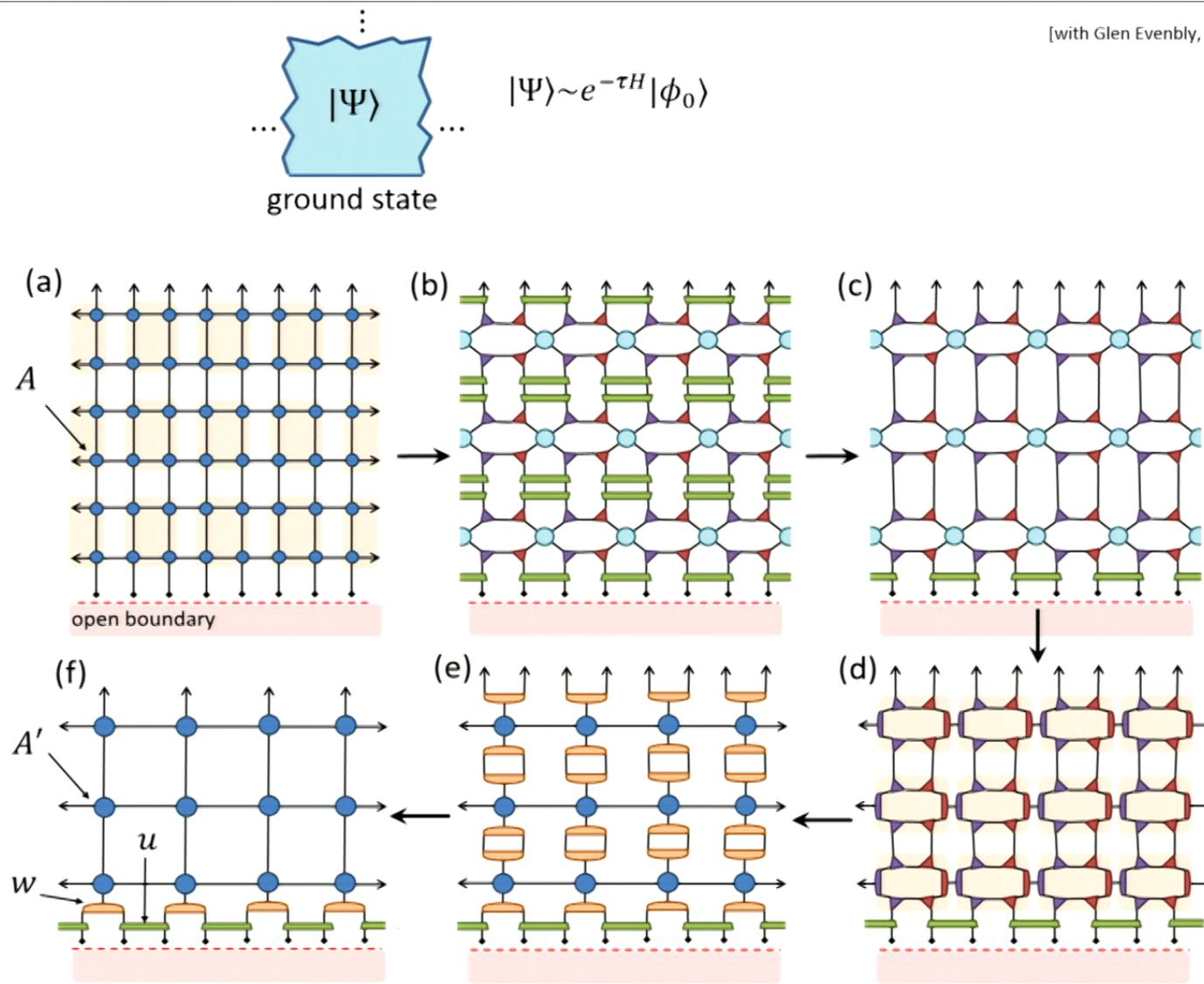
as a tensor network



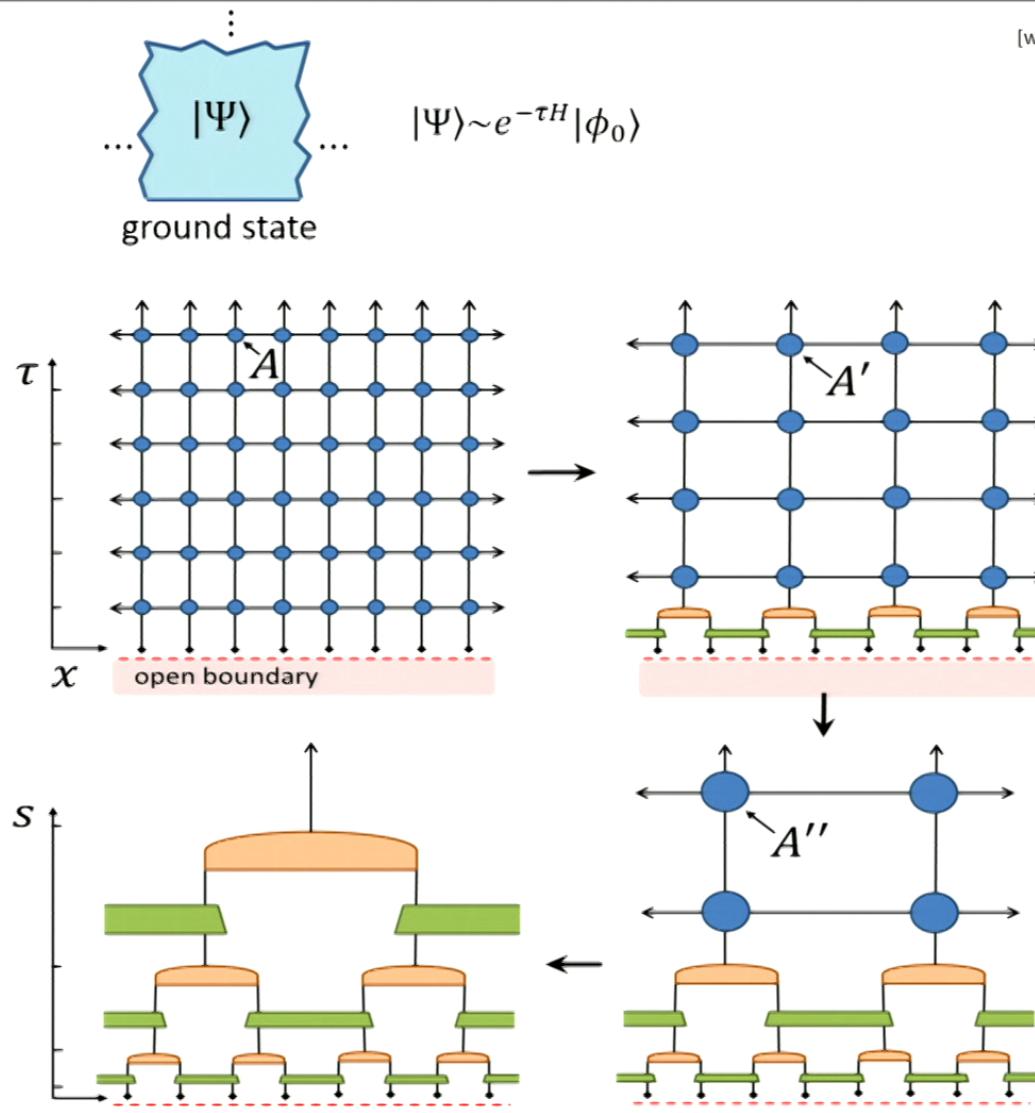
Euclidean time evolution on different geometries



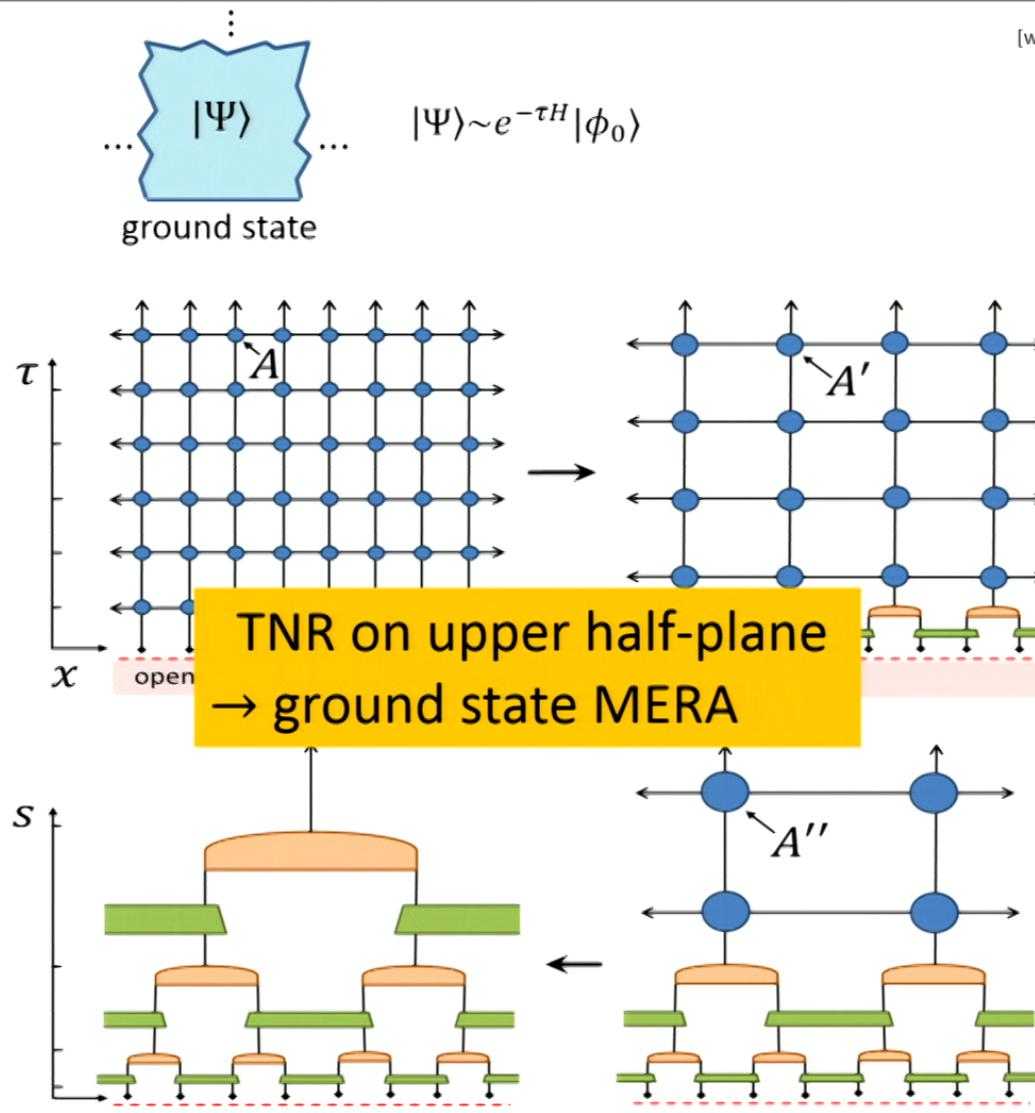
[with Glen Evenbly, 2015]



[with Glen Evenbly, 2015]

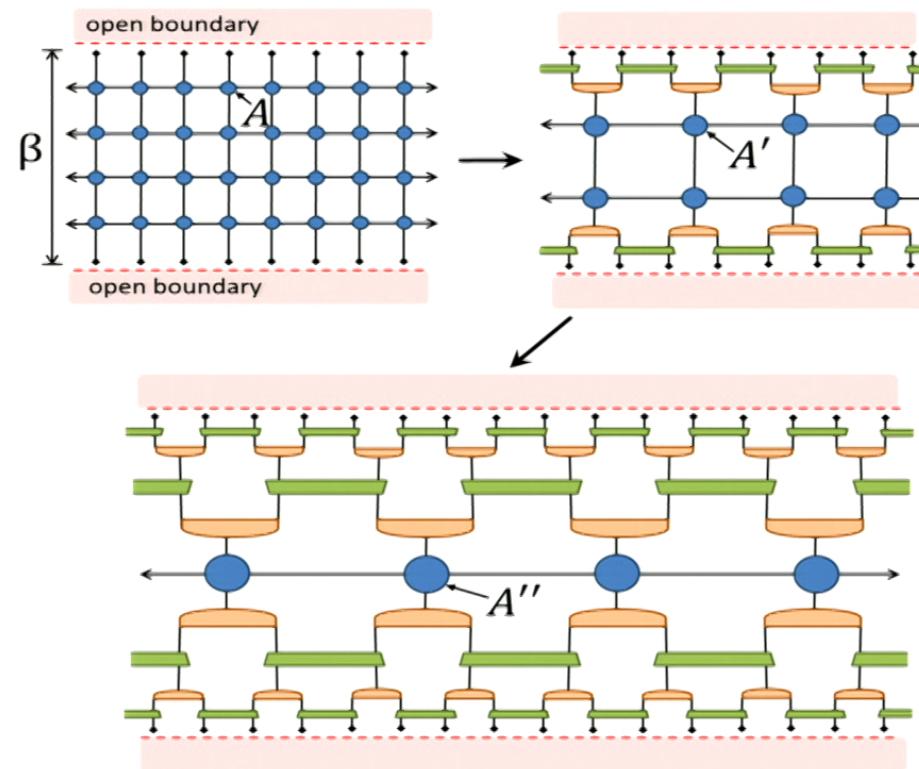


[with Glen Evenbly, 2015]



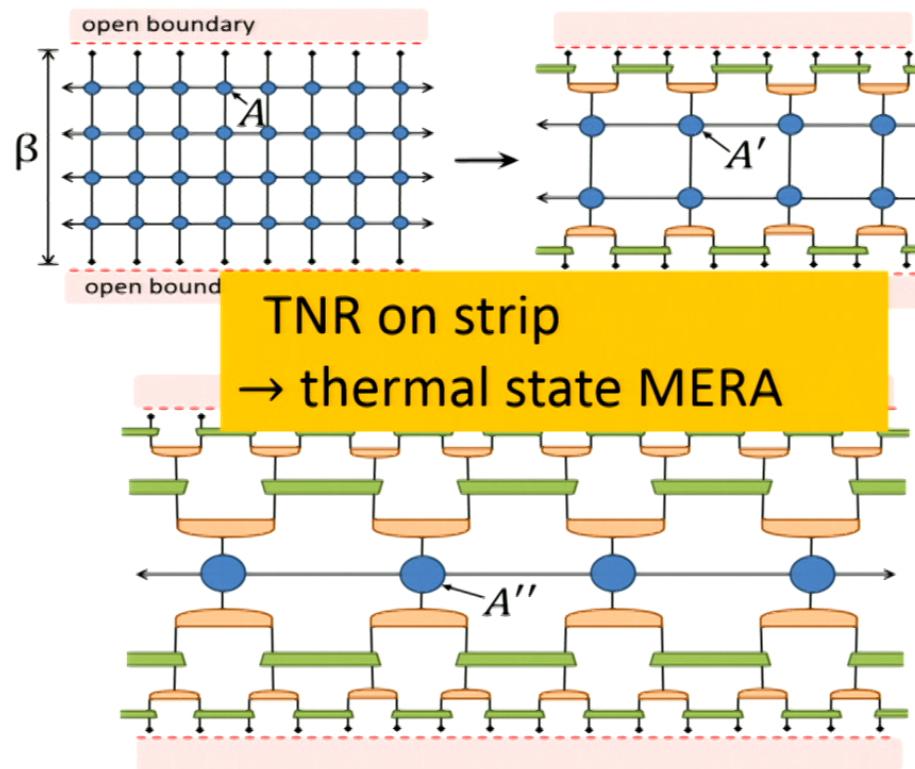
$$\dots \left\{ \rho_\beta \right\} \dots \quad \beta \quad \rho_\beta \sim e^{-\beta H}$$

thermal state



$$\dots \left\{ \rho_\beta \right\} \dots \quad \beta \quad \rho_\beta \sim e^{-\beta H}$$

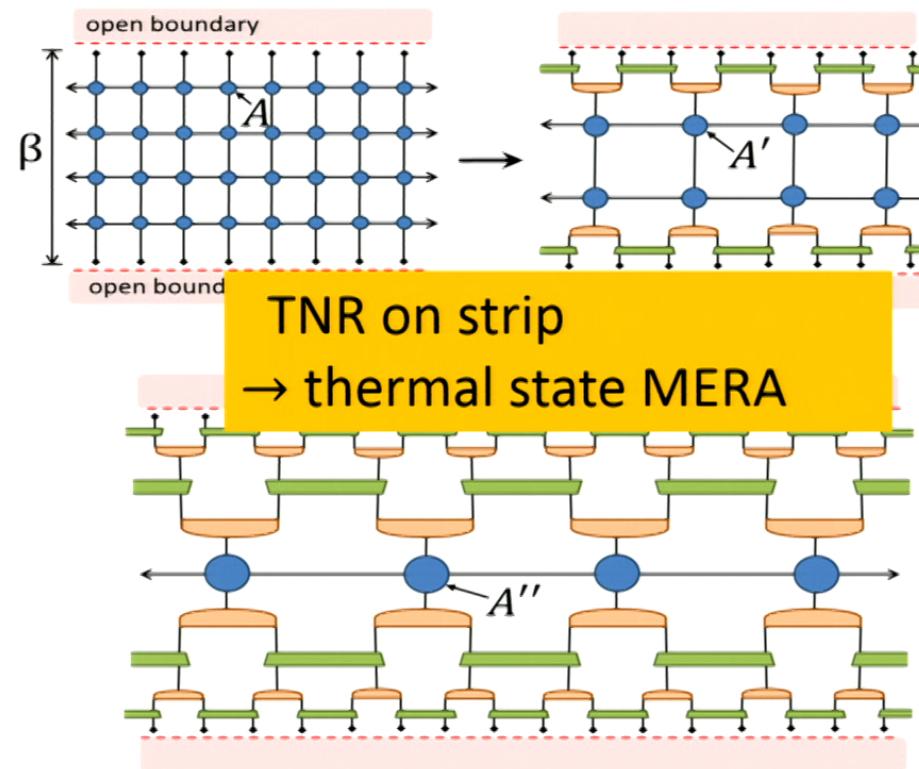
thermal state



ρ_β

$\rho_\beta \sim e^{-\beta H}$

thermal state

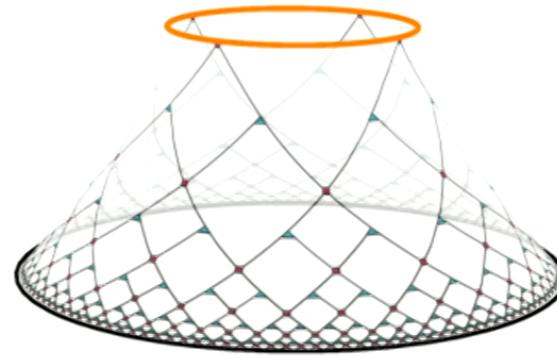


$$\text{MPS} \quad \begin{array}{c} \text{D} \\ \text{---} \\ \text{D} \\ \text{---} \\ \text{D} \end{array} = \frac{\text{D}}{4L} = \frac{1}{4L} \quad \text{MPS}$$
$$4L \left(1 + \frac{1}{2} + \frac{1}{4} + \dots \right)$$
$$4L \quad \sim L$$

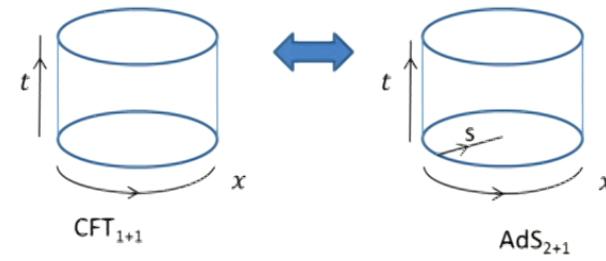
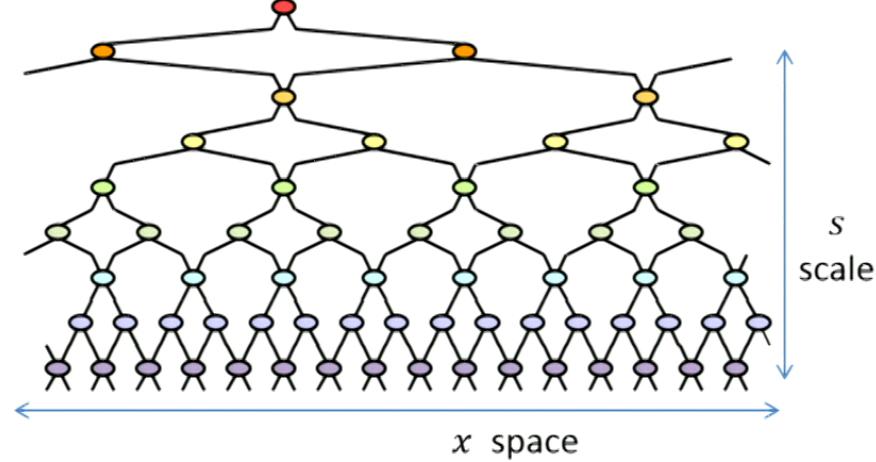


(iii) Tensor Networks in Holography

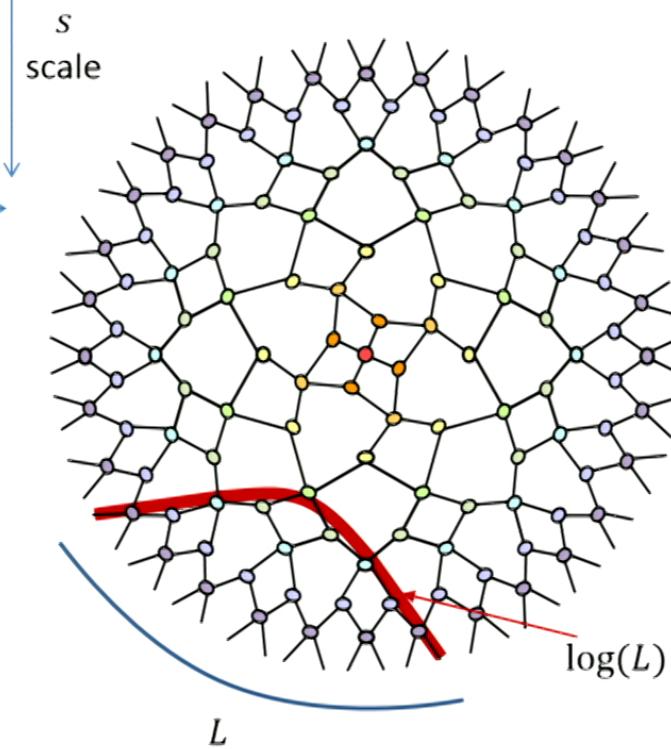
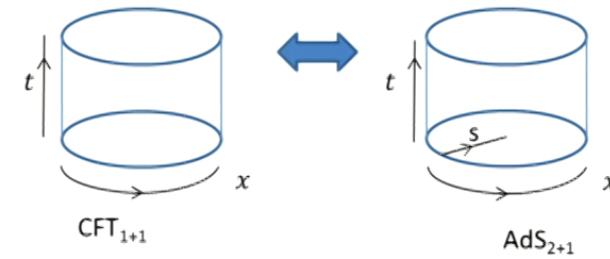
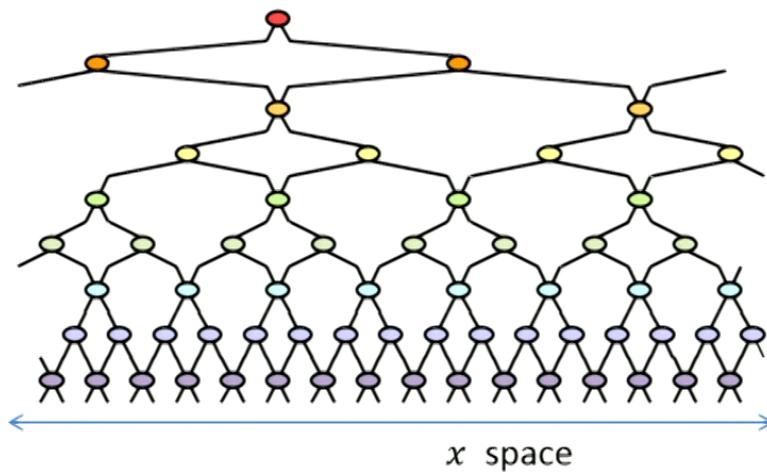
Toy models for holography/
emergent space-time



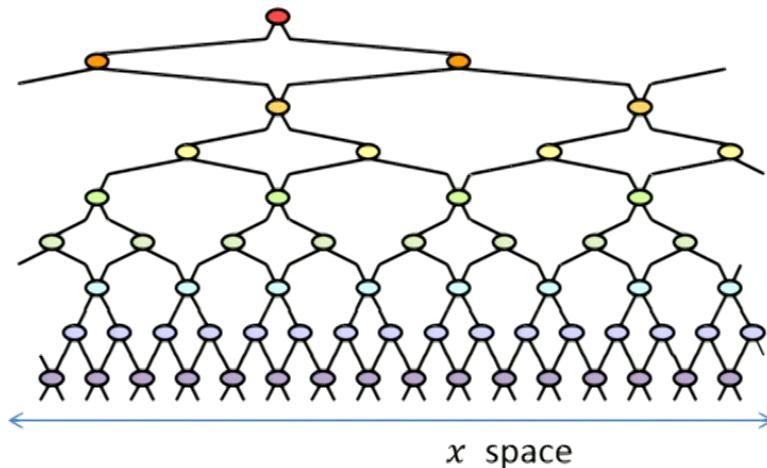
MERA and holography?



MERA and holography?



MERA and holography?



- entanglement entropy

$$S_L \approx \log(L)$$

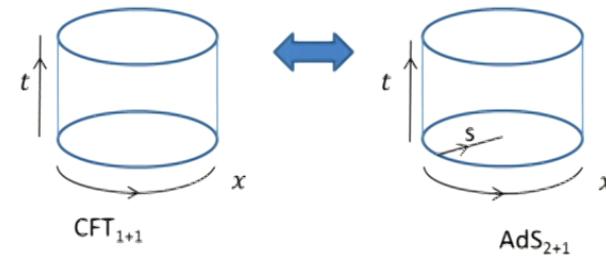
parallel to area of minimal surface in Ryu-Takayanagi

- two-point correlations

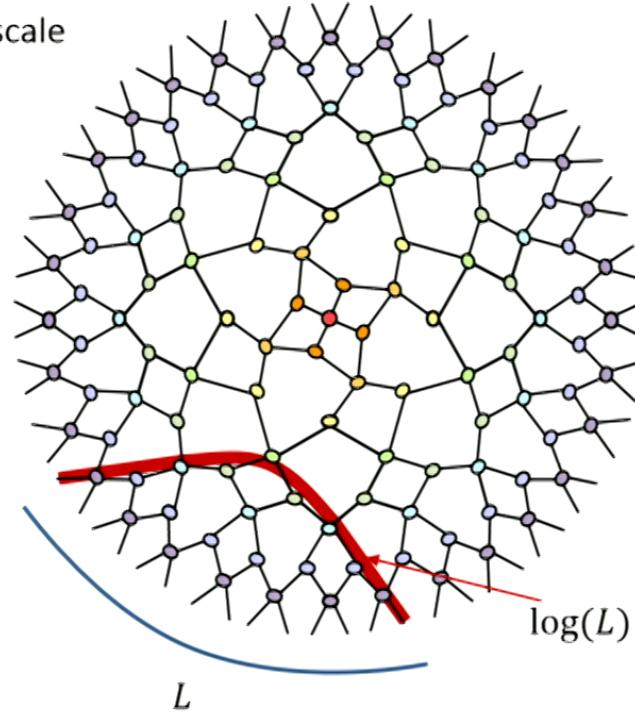
$$C(L) \approx L^{-2\Delta}$$

geodesic distance $D \approx \log(L)$ as in a hyperbolic geometry

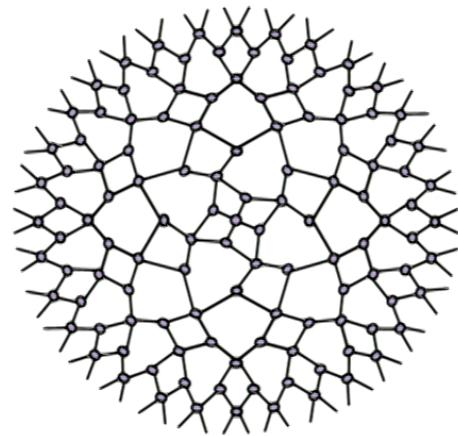
$$C(L) \approx e^{-D} = e^{-2\Delta \log(L)} = L^{-2\Delta}$$



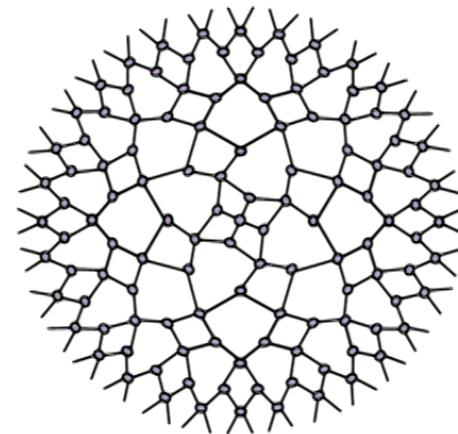
S
scale



multi-scale entanglement
renormalization ansatz (MERA)



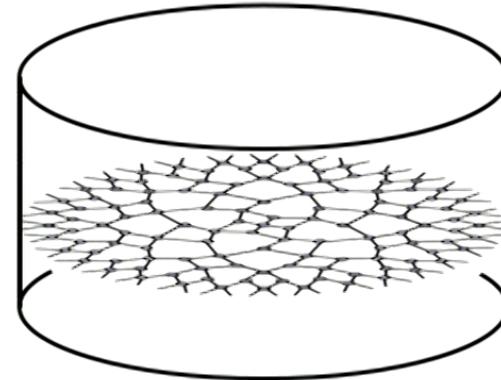
multi-scale entanglement
renormalization ansatz (MERA)



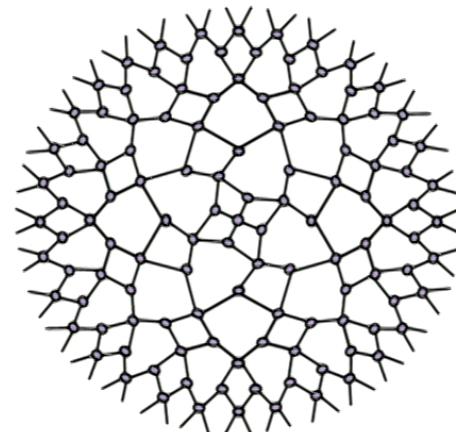
$\text{AdS}_3/\text{CFT}_2$

Swingle 2009, 2012

time slice of AdS_3 (hyperbolic plane H_2)



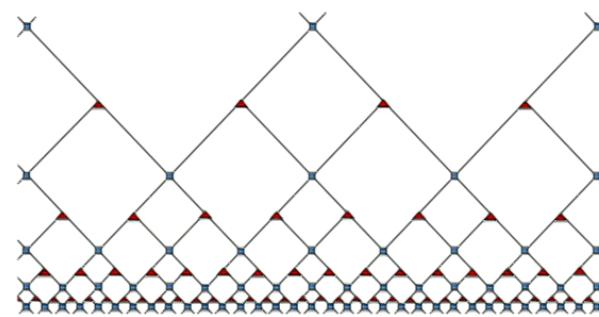
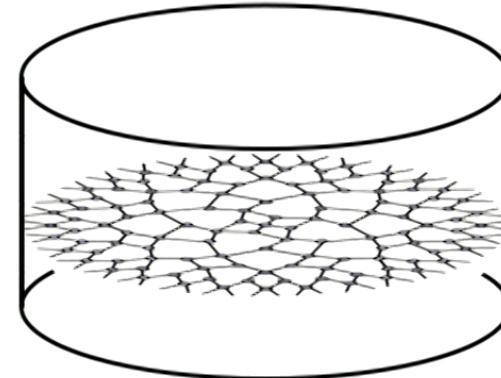
multi-scale entanglement
renormalization ansatz (MERA)



$\text{AdS}_3/\text{CFT}_2$

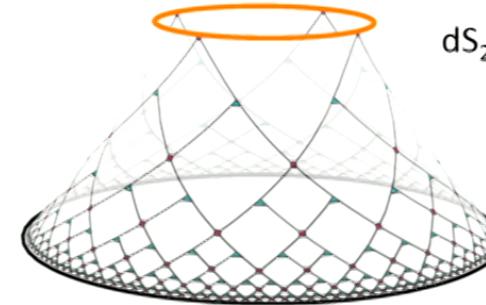
Swingle 2009, 2012

time slice of AdS_3 (hyperbolic plane H_2)

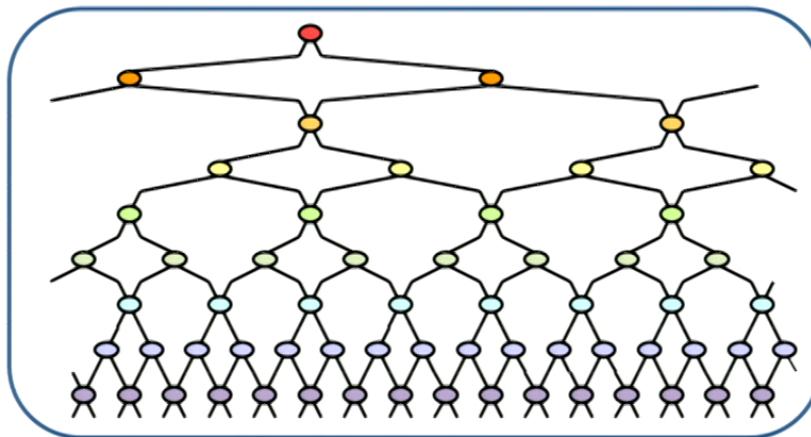


Czech, Lamprou, McCandlish, Sully, 2015-2016

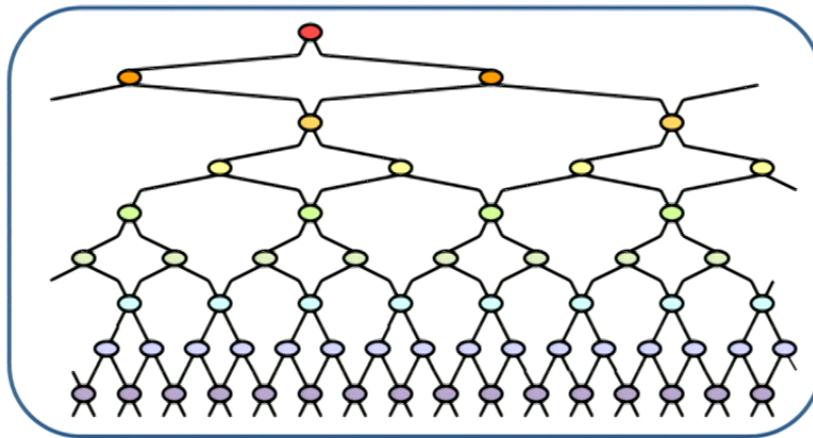
kinematic space (integral transform of H_2)



MERA = tensor network + isometric/unitary constraints



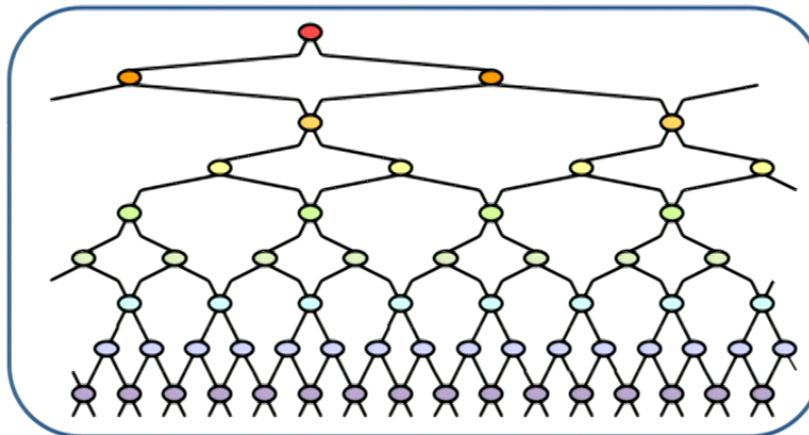
MERA = tensor network + isometric/unitary constraints



~ hyperbolic plane?

Euclidean metric signature
(Swingle 2009)

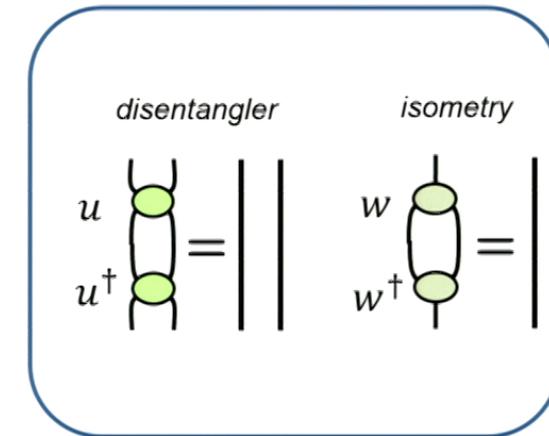
MERA = tensor network + isometric/unitary constraints



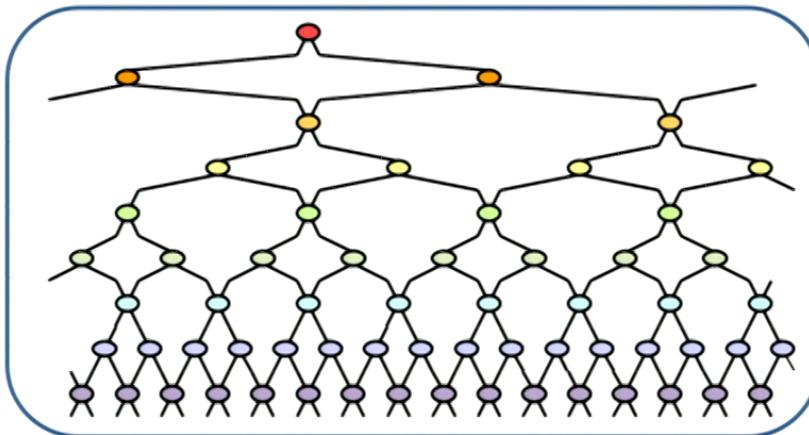
~ hyperbolic plane?

Euclidean metric signature

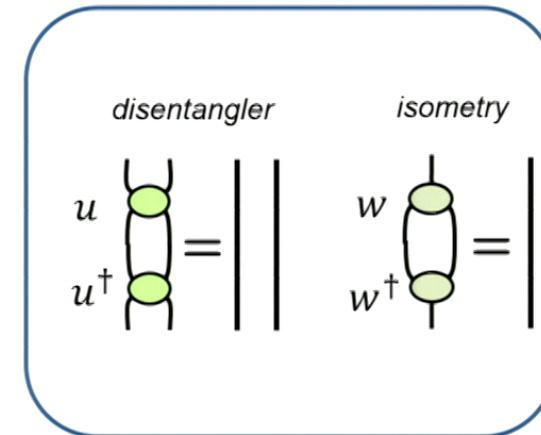
(Swingle 2009)



MERA = tensor network + isometric/unitary constraints

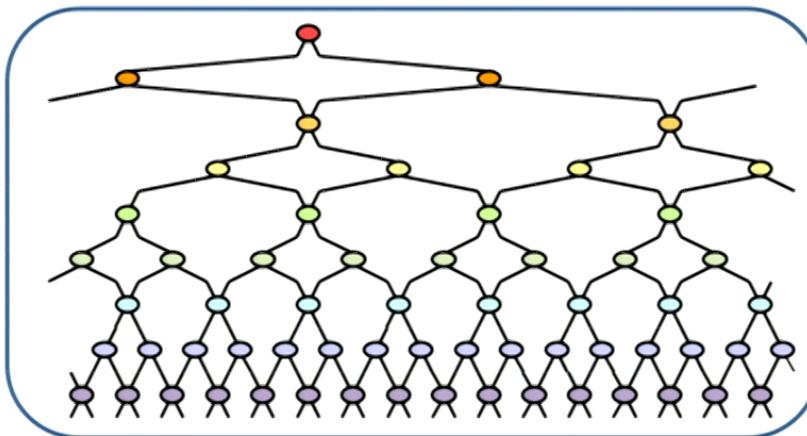


~ hyperbolic plane?
Euclidean metric signature
(Swingle 2009)

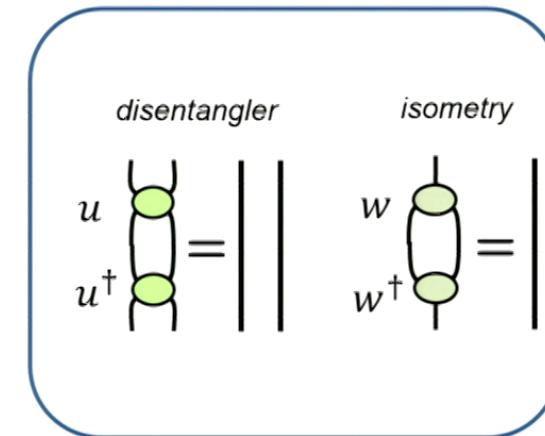


~ de Sitter space?
Lorentzian metric signature
(Beny 2011, Czech 2015)

MERA = tensor network + isometric/unitary constraints



~ hyperbolic plane?
Euclidean metric signature
(Swingle 2009)



~ de Sitter space?
Lorentzian metric signature
(Beny 2011, Czech 2015)

MERA's
causal structure
= Lorentzian signature



MERA is a discretization
of Kinematic space - Czech
(space of geodesics of the hyperbolic plane,
and NOT the hyperbolic plane)

Many-body entanglement and tensor networks

the many-body
computational
challenge

ground state
entanglement

tensor networks

simulation cost
 $\exp N$

Area law
 $S(A) \sim |\partial A|$

ground state
representation
simulation cost
 $O(N)$

julia
exact diagonalization, Lanczos
free fermion formalism

computation of
entanglement entropy

structure of ground states
RG transformation
connection to holography,
statistical mechanics