

# Holography inspired numerical experiments on exactly solvable tensor networks.

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Based on: arXiv:1711.03109

*Holography and criticality in matchgate tensor networks*

with: Alexander Jahn, Marek Gluza & Jens Eisert

& Based on: unpublished work

*Stabilizer code synthesis from tensor network geometries*

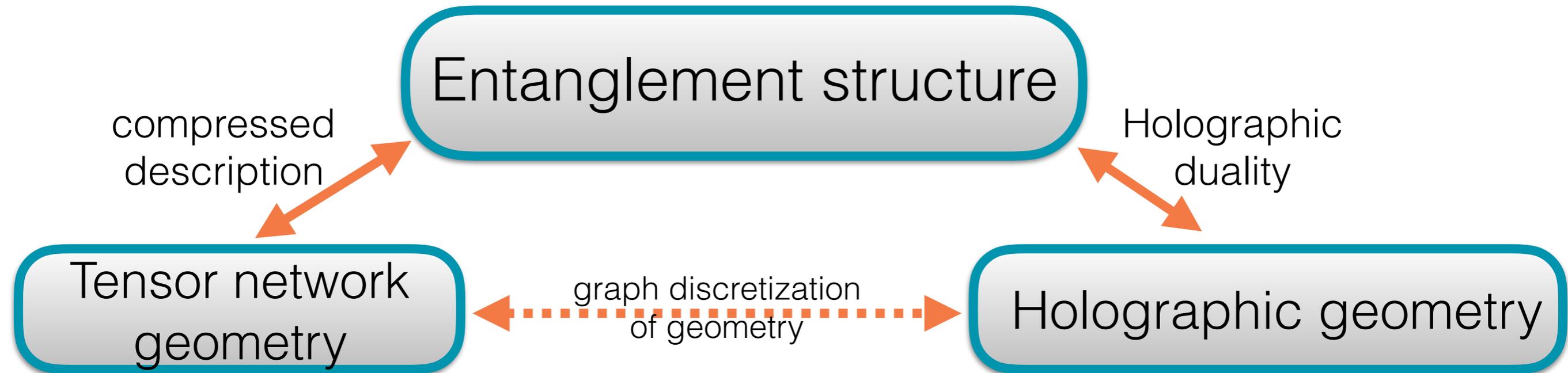
with: Arkin Tikku

Freie Universität  Berlin



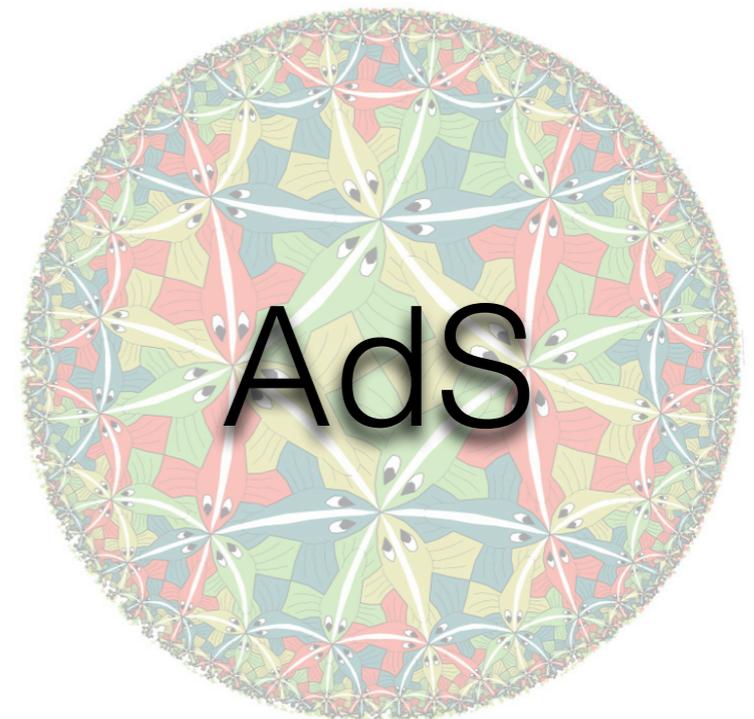
Alexander von Humboldt  
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# Holography & TN



based on example:

CFT



# Motivation

1. Build "synthetic" entanglement structure from tensor network geometries?
  - Construct quantum error-correcting codes
  - Understand holography beyond CFTs ( $H_2$  geom.)
2. Elucidate necessary assumptions for holography
  - Are randomness assumptions in TN necessary ?
  - Is a strongly interacting CFT necessary ?
  - How does integrability obstruct holography ?

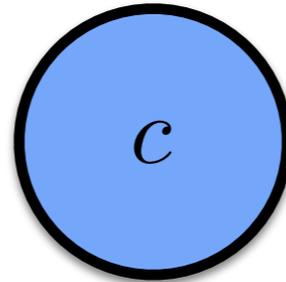
# Outline

1. Tensor network review.
  - States, expectation values & ( computer ) complexity
2. Match-gate tensor network ( free-fermions )
  - Majorana operators,
  - Covariance matrix, Wick's theorem & n-point functions.
  - Parent Hamiltonian & nullifiers
  - Jordan-Wigner transformation, 5qubit code states
  - Efficient contraction.
  - Numerical results, interpretation
3. Stabilizer tensor networks
  - Generalized Pauli group, 5qubit code states
  - Stabilizer states, Calculating n-point functions
  - Efficient contraction
  - Numerical results
4. Conclusions and further work.

# Tensor network review

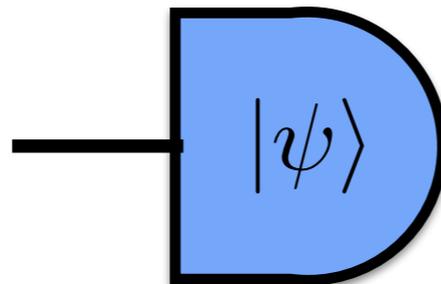
# Tensors

Scalars  
c-numbers



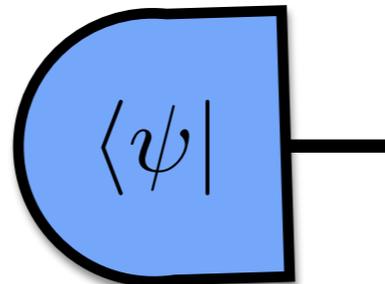
$c$

Ket  
pure state



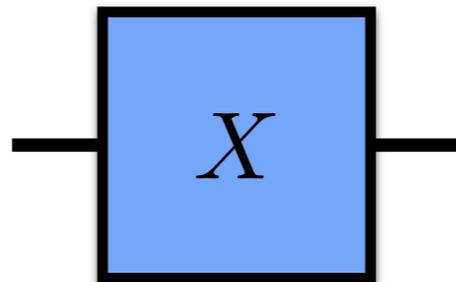
$$\sum_j \psi_j |j\rangle$$

Bra  
pure state

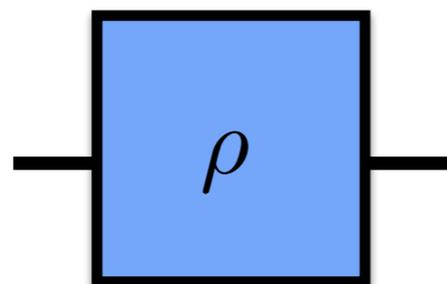


$$\sum_j \bar{\psi}_j \langle j|$$

Operator:  
i.e. observable,  
unitary,  
density matrix



$$\sum_{i,j} X_{i,j} |i\rangle \langle j|$$



$$\sum_{i,j} \rho_{i,j} |i\rangle \langle j|$$

# Contraction

Expectation value

$$X_i^j \bar{\psi}^i \psi_j \quad \langle \psi | X | \psi \rangle = \langle \psi | \quad X \quad | \psi \rangle$$

Unitary evolution

$$U_i^j \psi_j \quad U | \psi \rangle = U \quad | \psi \rangle$$

Trace

$$X_i^j \delta_j^i \quad \text{Tr}[X] = X$$

Partial trace

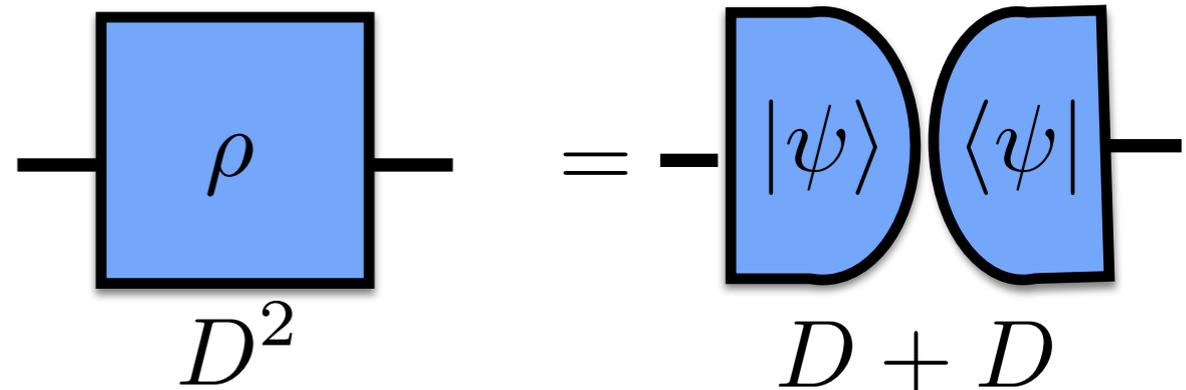
$$\rho_{i_a, i_b}^{j_a, j_b} \delta_{j_b}^{i_b} \quad \rho_A = \text{Tr}_B[\rho_{AB}] = \rho_{AB}$$

# Factorization(s)

Pure state  
density matrix

$$\rho = |\psi\rangle\langle\psi|$$

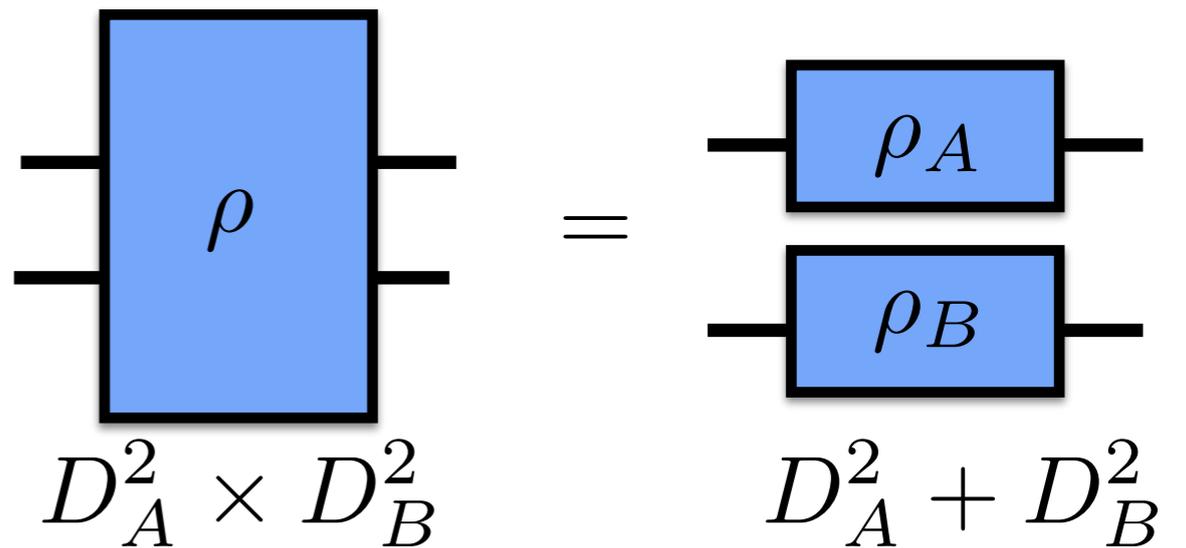
$$\rho_i^j = \psi_i \bar{\psi}^j$$



Product state  
(similarly op.)

$$\rho = \rho_A \otimes \rho_B$$

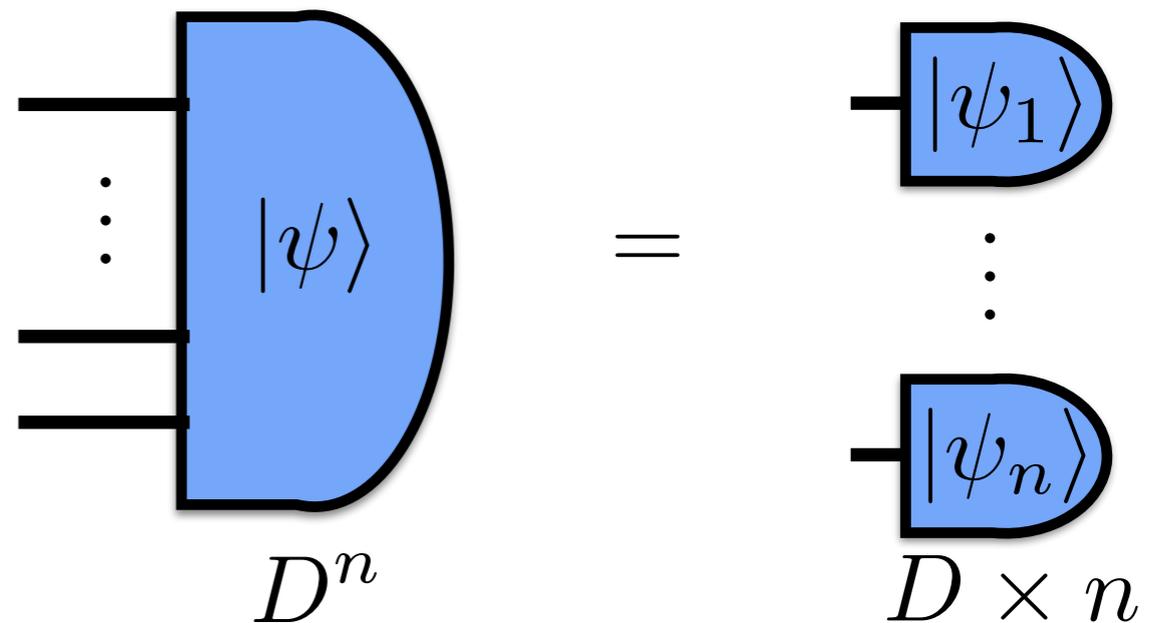
$$\rho_{i_a, i_b}^{j_a, j_b} = \rho_{i_a}^{j_a} \rho_{i_b}^{j_b}$$



Pure product state (ket)

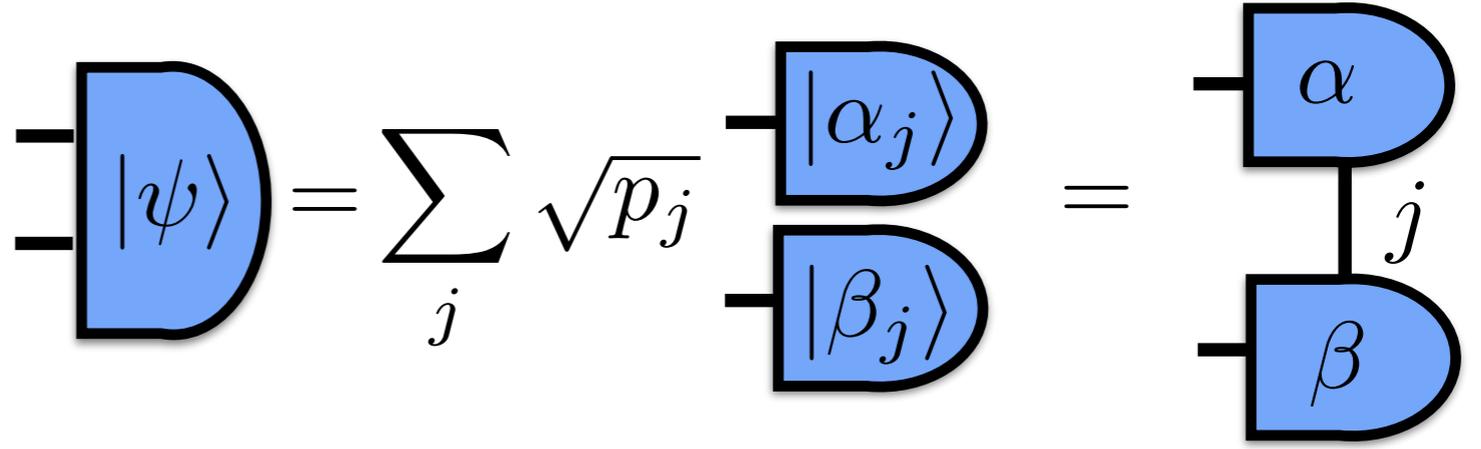
$$|\psi\rangle = |\psi_1\rangle \otimes \dots \otimes |\psi_n\rangle$$

$$\psi_{\vec{i}} = \psi_{i_1} \dots \psi_{i_n}$$



# Schmidt decomposition

Entangled state

$$|\psi\rangle = \sum_j \sqrt{p_j} |\alpha_j\rangle \otimes |\beta_j\rangle$$


$D_A \times D_B$   $s \times (D_A + D_B)$   $s \times (D_A + D_B)$

$$\psi_{i_a, i_b} = \alpha_{i_a, s_a} \beta_{i_b, s_b} \delta^{s_a, s_b}$$

**low entanglement** states  
well approximated by  
**low Schmidt** rank  $s$ .

+

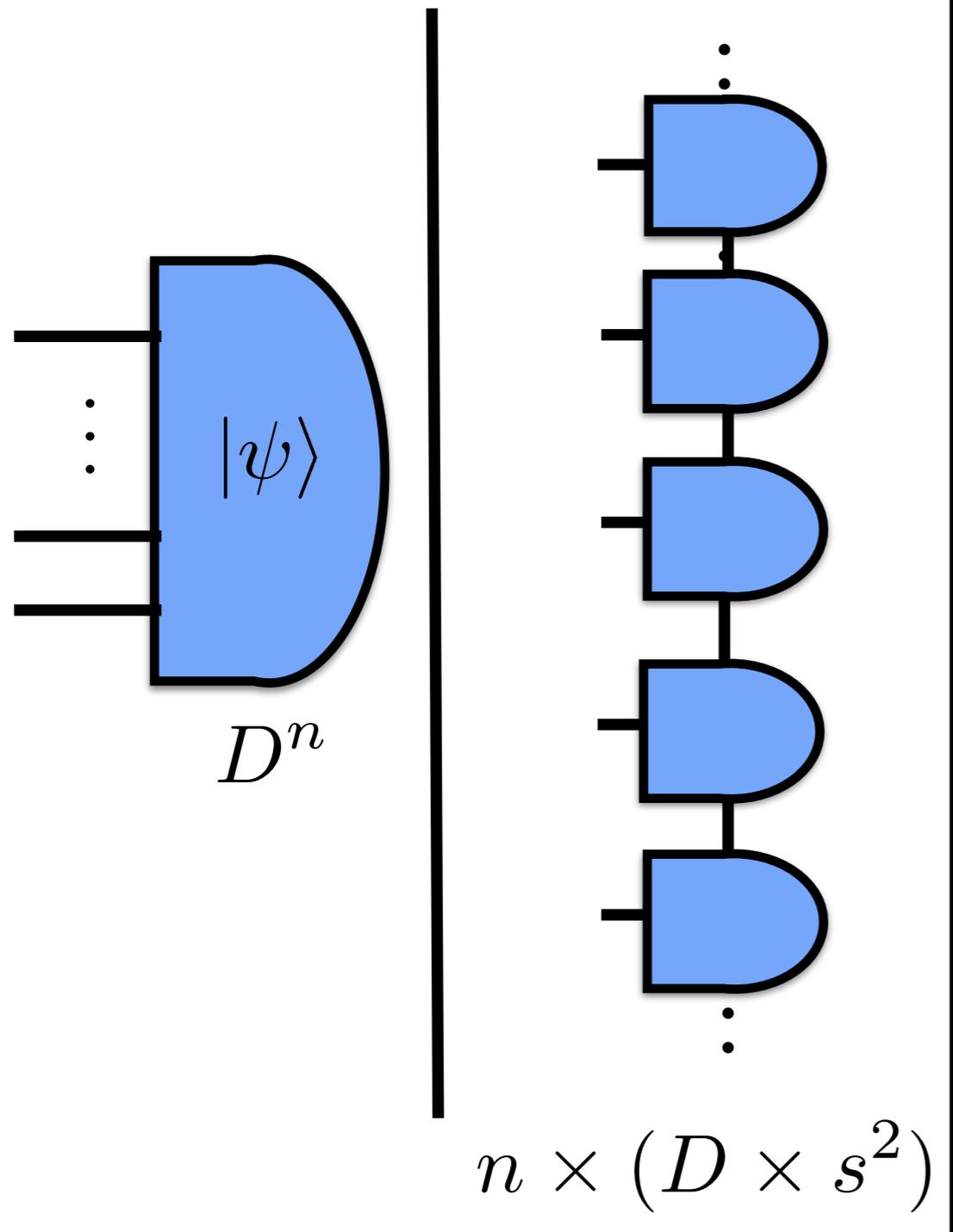
Entanglement  
area law (low)

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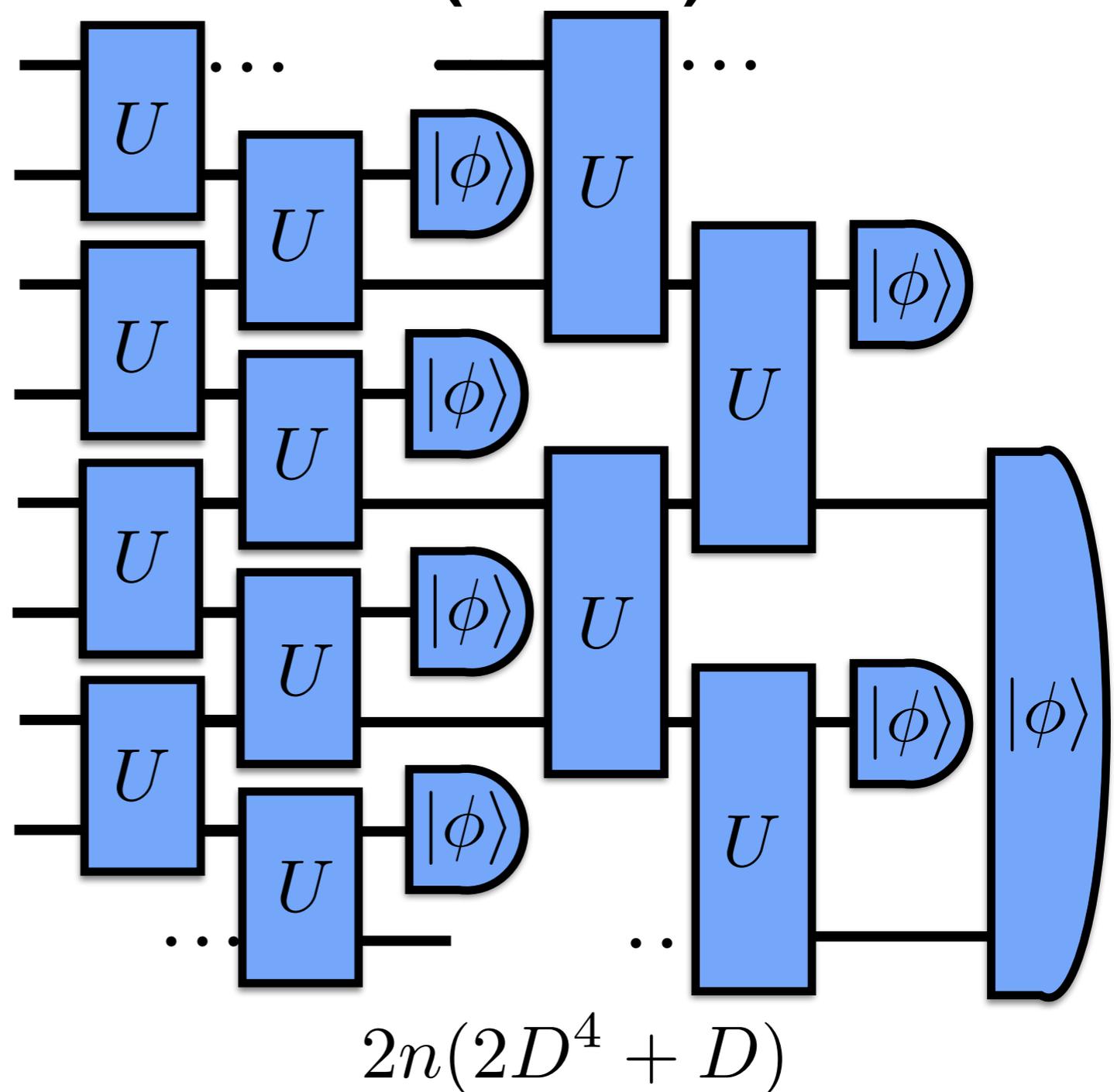
Basis for tensor network ansatz

# Tensor network ansatz(e)

Matrix Product States  
**(MPS)**



Multi-scale Entanglement  
Renormalization Ansatz  
**(MERA)**

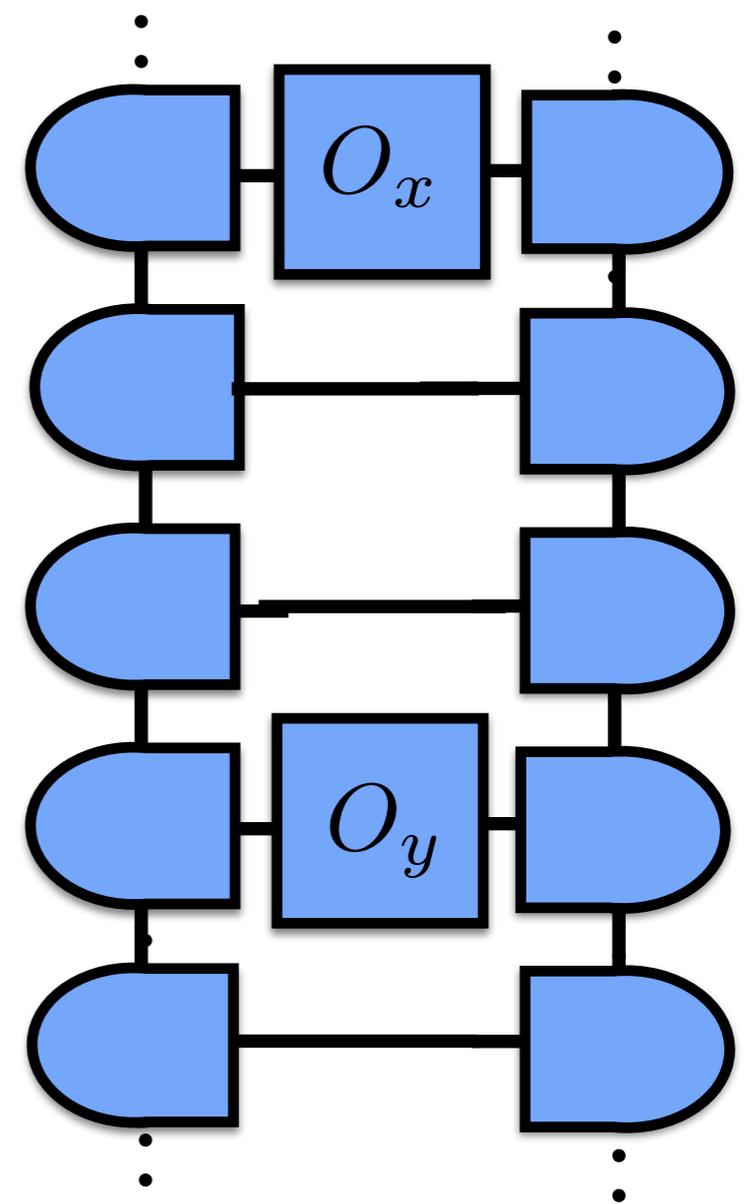
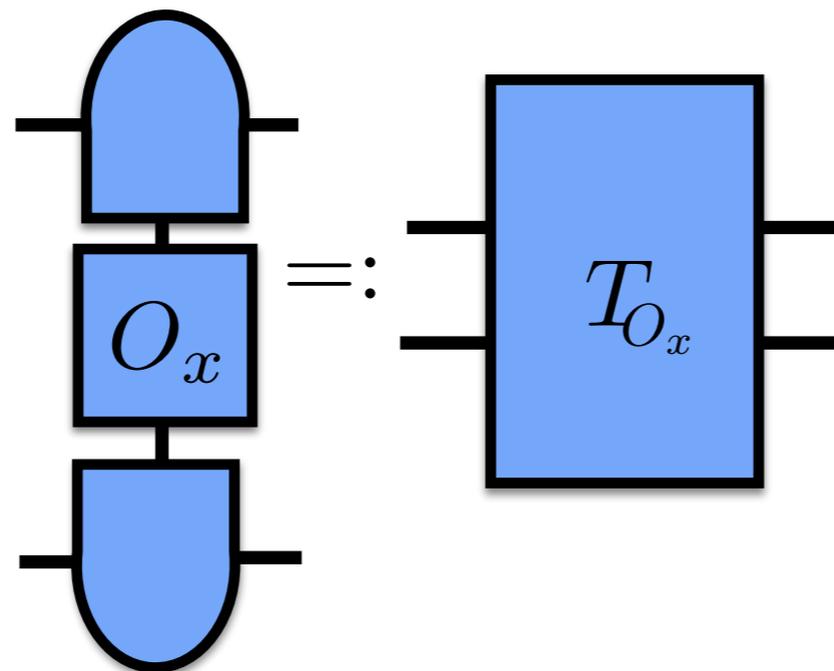
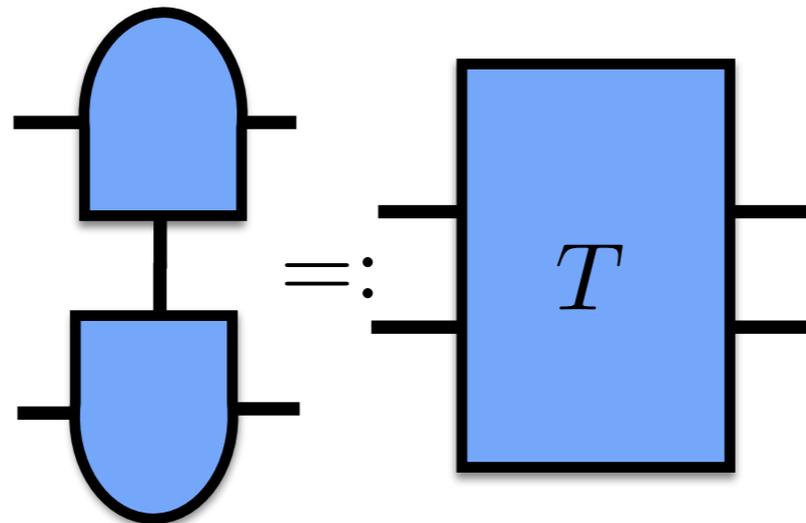
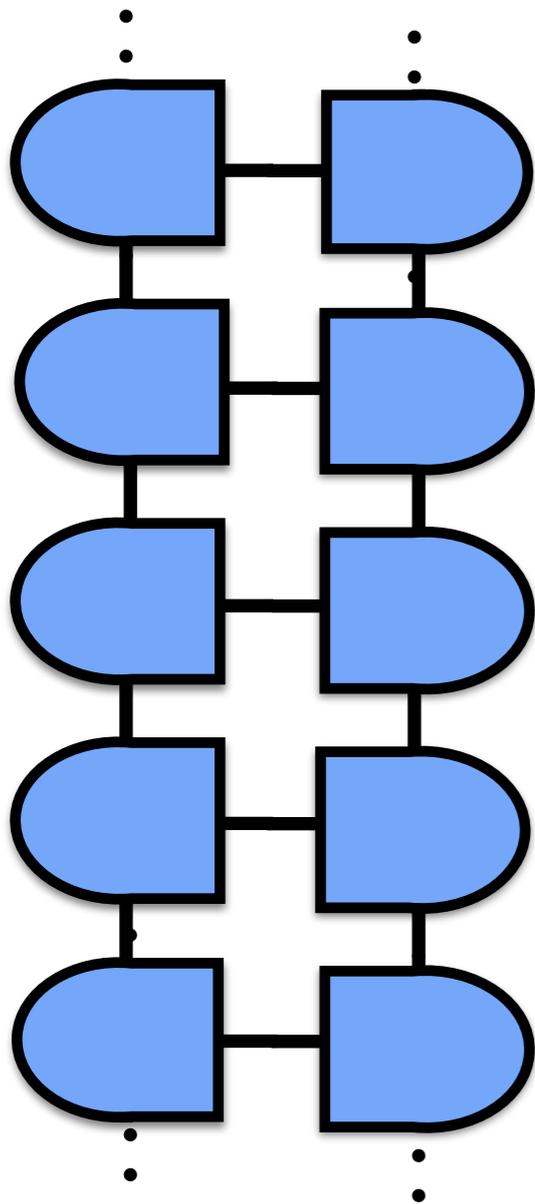


# Normalization and expectation values

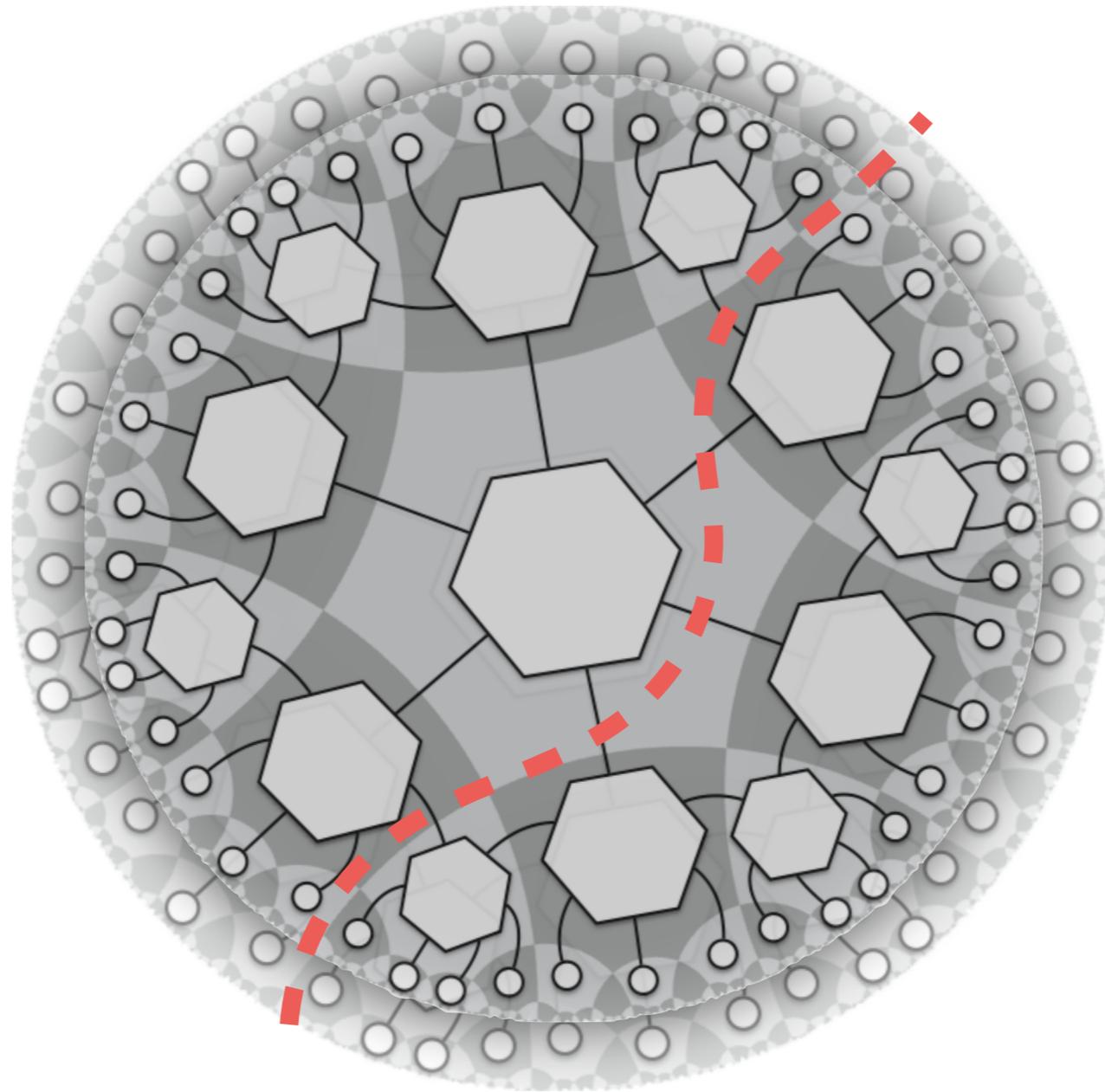
Example: Matrix Product States (**MPS**)

$$1 = \langle \psi | \psi \rangle = \text{Tr}[T^n]$$

$$\langle \psi | O_x O_y | \psi \rangle = \text{Tr}[T_{O_x} T^{d_1} T_{O_y} T^{d_2}]$$

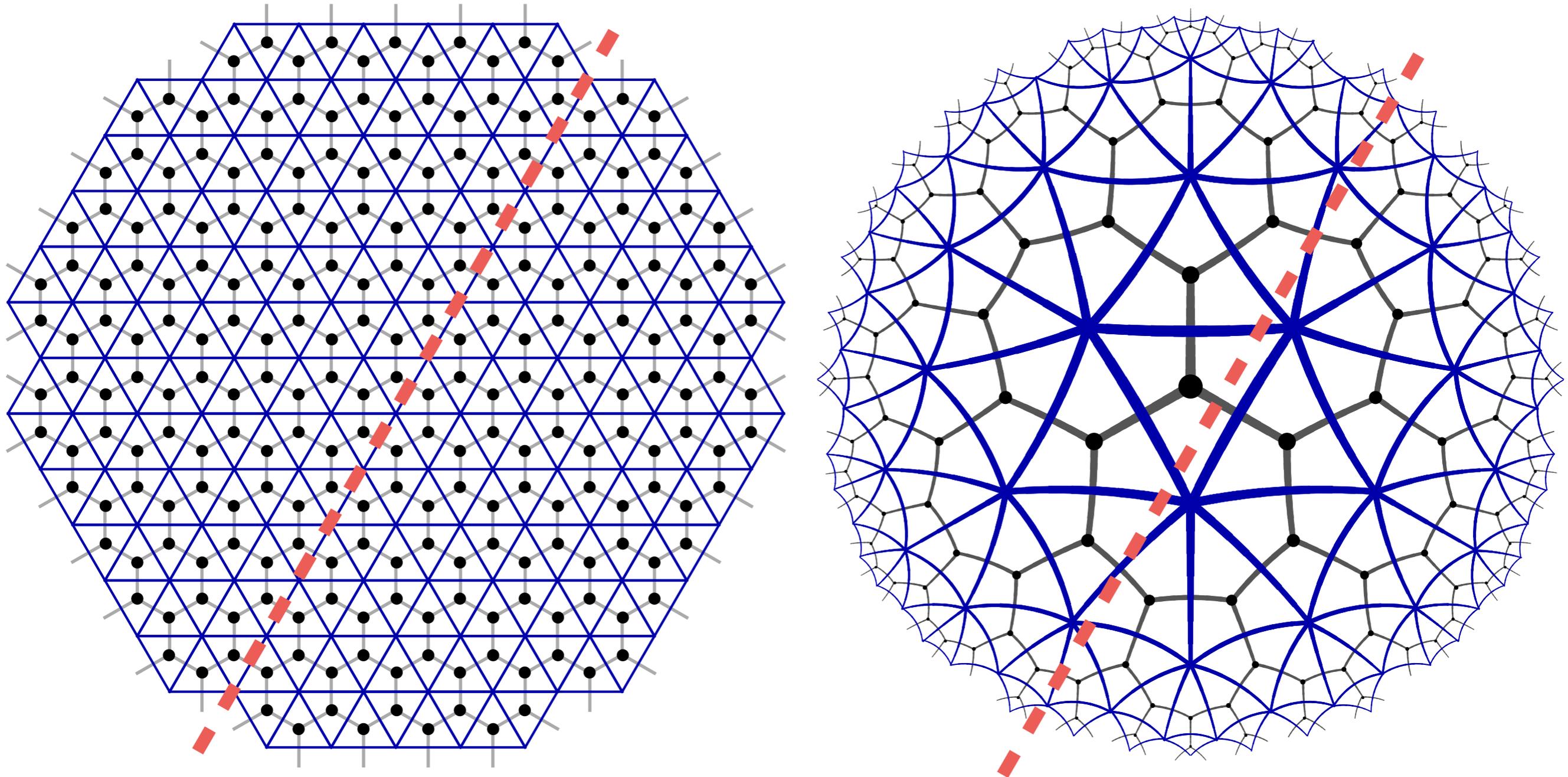


# Beyond MPS and MERA



Computer memory required (norm & expectation values ) is exponential in the “tree-width” of tensor network graph.

# Curse of polynomial tree-width



Most tensor networks have polynomial tree-width.  
Only 1D MPS (constant TW) and (1D) MERA-like ( $\log n$ ).

What tools can we use to run large tensor network experiments beyond  $H_2$ ?

# Exactly solvable TN

## Gaussian fermion states

- Continuous parameter space.
- *Planar graph* connectivity ( otherwise inefficient )
- Bond dimension  $d=2$
- Free-fermion spectrum
- Allows approximation Ising CFT lattice models.

(nullifiers)

$$n_j = \sum_{\ell} \alpha_j^{\ell} m_{\ell}$$

$$n_j |\psi\rangle = 0$$

## Stabilizer states

- Discrete parameter space.
- Arbitrary graph connectivity
- Flexible bond dimension  $d = p$  prime
- Flat spectrum
- Exact QEC properties.

$$I \equiv \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix}, X \equiv \begin{bmatrix} 0 & 1 \\ 1 & 0 \end{bmatrix}, Y \equiv \begin{bmatrix} 0 & -i \\ i & 0 \end{bmatrix}, Z \equiv \begin{bmatrix} 1 & 0 \\ 0 & -1 \end{bmatrix}.$$

$$\begin{aligned} g_1 &= X Z Z X I \\ g_2 &= I X Z Z X \\ g_3 &= X I X Z Z \\ g_4 &= Z X I X Z \end{aligned}$$

$$g_j |\psi\rangle = |\psi\rangle$$

Matchgate tensors  
( Fermionic Gaussian states )  
(a.k.a. free-fermions)

# Fermionic Gaussian states

$O(n^2)$  parameters

Majorana operators:

$$m_{2k-1} = f_k + f_k^\dagger$$

$$m_{2k} = i(f_k^\dagger - f_k)$$

Anti-commutation:

$$\{m_j, m_k\}_+ = 2\delta_{j,k}$$

Covariance-matrix:

$$\Gamma_{j,k}(\rho) = \text{Tr} \left( \rho \frac{i}{2} [m_j, m_k] \right)$$

Coherent (pure) Gaussian states:

$$|\psi\rangle =: U_g : |\emptyset\rangle = \mathcal{Z}^{-1/2} \exp \left( \frac{1}{2} \sum_{j,k=1}^n A_{j,k} f_j^\dagger f_k^\dagger \right) |\emptyset\rangle$$

Quadratic Hamiltonian:

$$H_g = \frac{i}{4} \sum_{j,k=1}^{2n} g_{j,k} m_j m_k$$

$$\text{Gaussian unitary: } U_g = e^{-iH_g}$$

# Parent Hamiltonian

Pure gaussian states can be specified as ground states of a non-degenerate quadratic Hamiltonian

$$H_g = \frac{i}{4} \sum_{j,k=1}^{2n} g_{j,k} m_j m_k$$

Upon block diagonalization of the anti-hermitian matrix

$$H_g = \frac{i}{2} \sum_{k=1}^n \varepsilon_k \tilde{m}_{2k-1} \tilde{m}_{2k}$$

Nullifiers:  $\tilde{f}_k |\psi\rangle = 0$

$$= \frac{1}{2} \sum_{k=1}^n \varepsilon_k (\tilde{f}_k^\dagger \tilde{f}_k - \tilde{f}_k \tilde{f}_k^\dagger)$$

The new fermionic operators are sometimes called nullifiers. They are linear combinations of the original ones.

# Fermionic Wick's theorem

For two pure fermionic gaussian states:

$$\langle \phi_1 | m_1^{x_1} m_2^{x_2} \dots m_{2n}^{x_{2n}} | \phi_2 \rangle = \langle \phi_1 | \phi_2 \rangle \text{Pf} (i\Delta | \vec{x})$$

Where in terms of the covariance matrices,

$$\Delta = (-2 + i\Gamma_1 - i\Gamma_2) (\Gamma_1 + \Gamma_2)^{-1}$$

And Pf is the Pfaffian, which satisfies:

$$\text{Pf}(M)^2 = \det(M)$$

$$\text{Pf}(M) = \frac{1}{2^k k!} \sum_{\sigma \in S_n} (-1)^\sigma M_{\sigma(1),\sigma(2)} \dots M_{\sigma(n-1),\sigma(n)}.$$

# Matchgate tensors

Pure gaussian states correspond to match-gate tensors when considering occupational basis.

$$|\psi_g\rangle = \sum_{j \in \{0,1\}^n} \mathcal{T}(j) (f_1^\dagger)^{j_1} \dots (f_n^\dagger)^{j_n} |\emptyset\rangle$$

## Efficient closed operations on match-gate tensors.

1. Cyclic reordering of labels.
2. Tensor product of two.
3. Contraction of neighboring labels.

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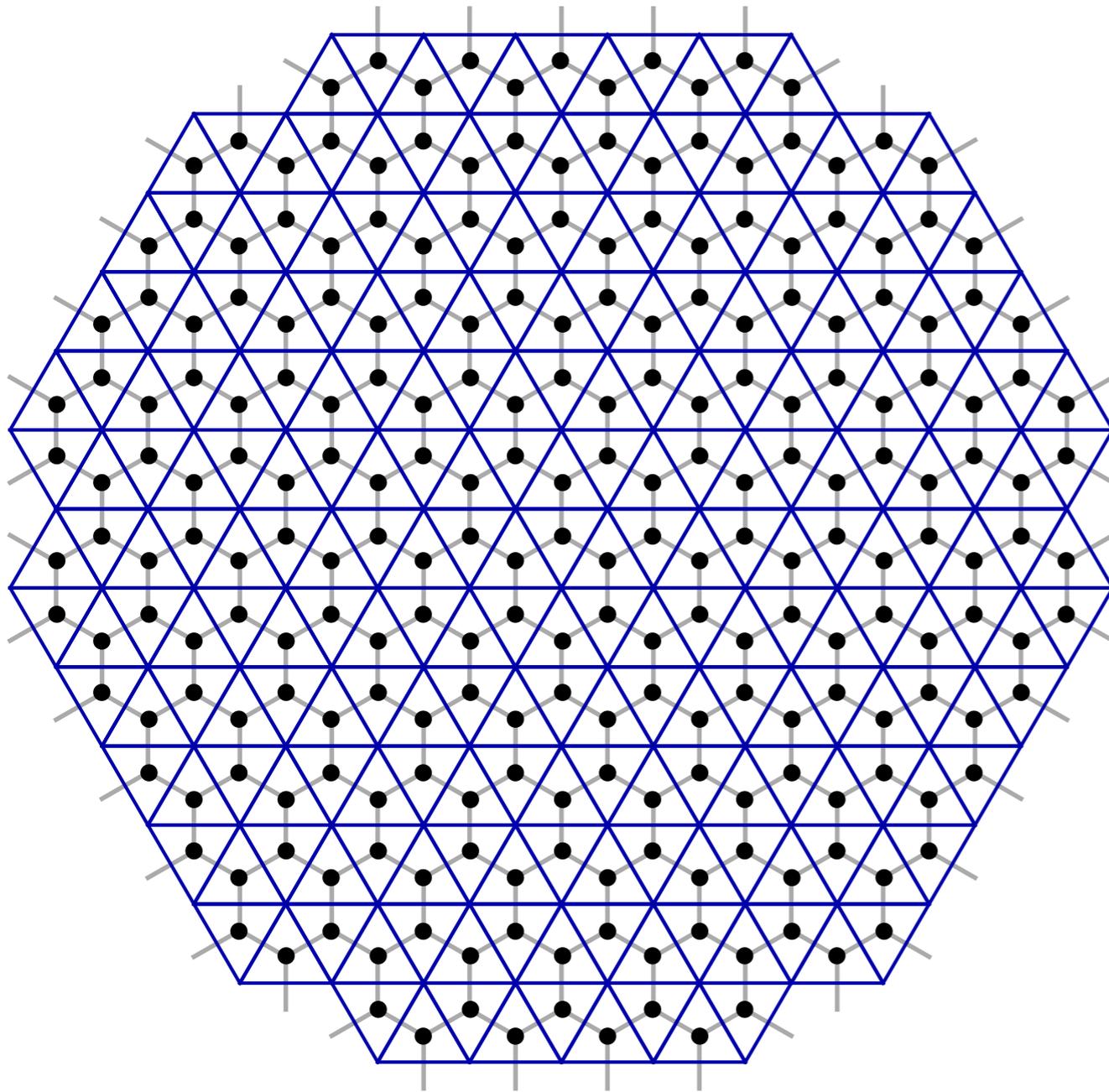
Contract **Planar** match gate TNs efficiently

Sergey Bravyi, *Contraction of matchgate tensor networks on non-planar graphs*  
*arXiv:0801.2989* Contemporary Mathematics, Vol. 482, pp. 179-211 (2009)

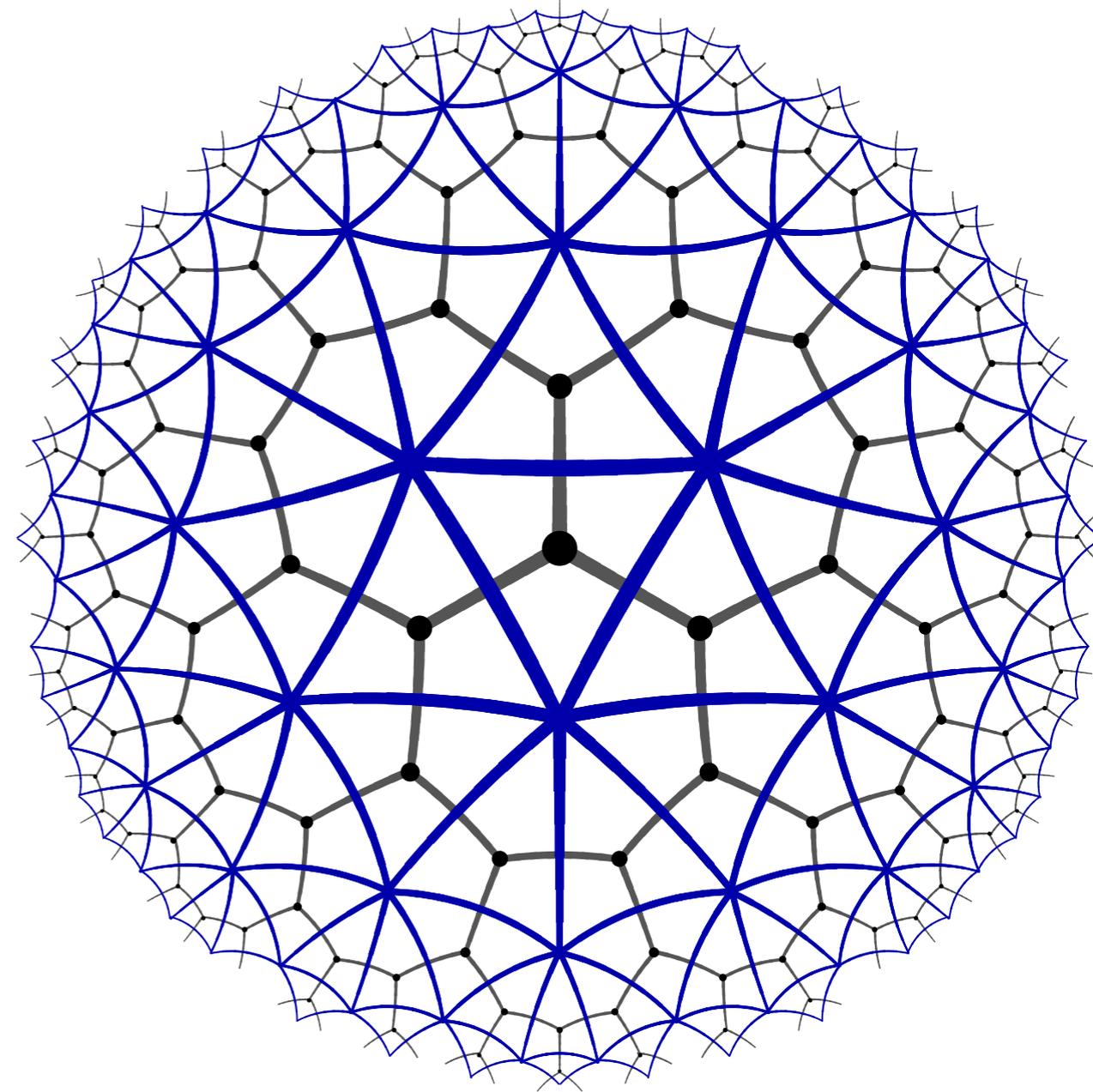
# Numerical experiments

## Matchgate TNs

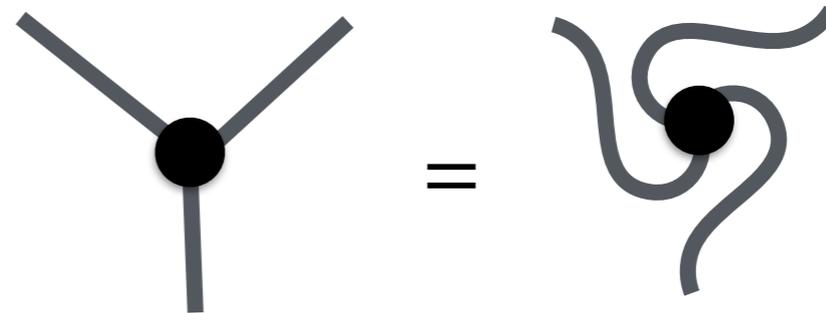
Flat geometry



H<sub>2</sub> geometry

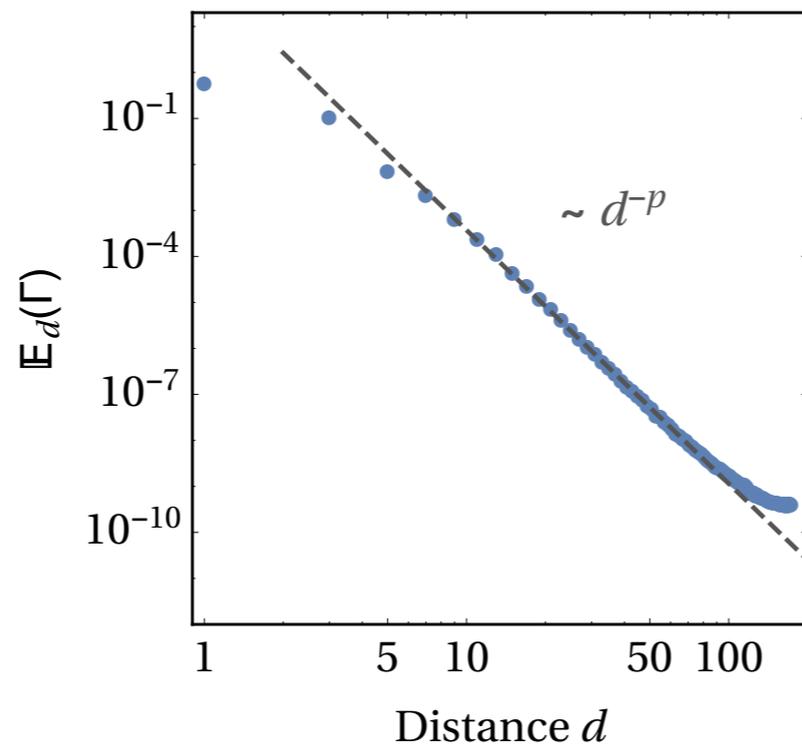
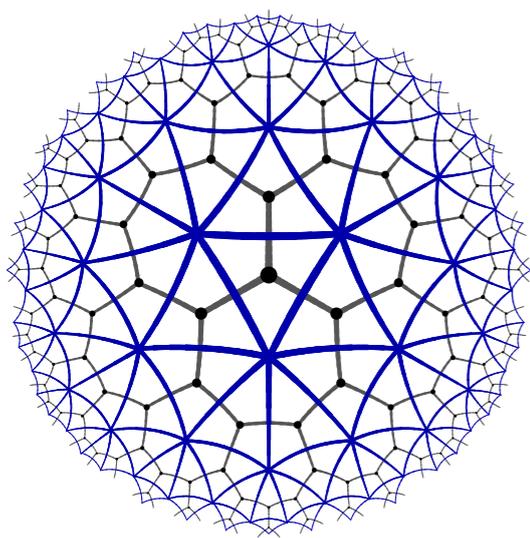
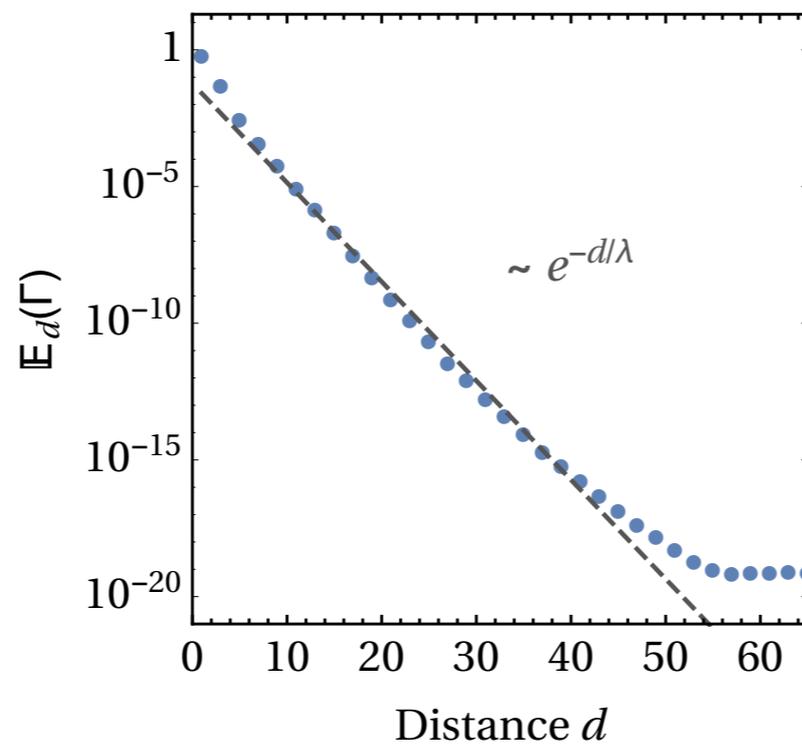
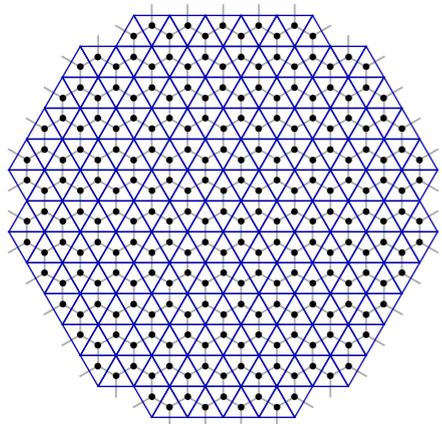


Single (tensor rank = 3)  
cyclic invariant tensor.  
Just one parameter left!

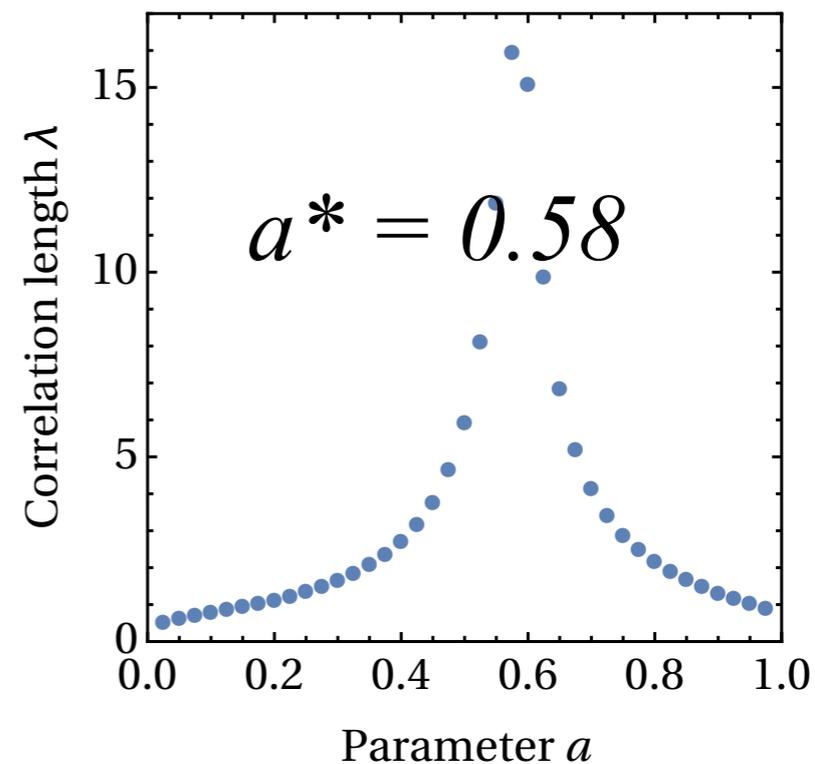


## Covariance decay

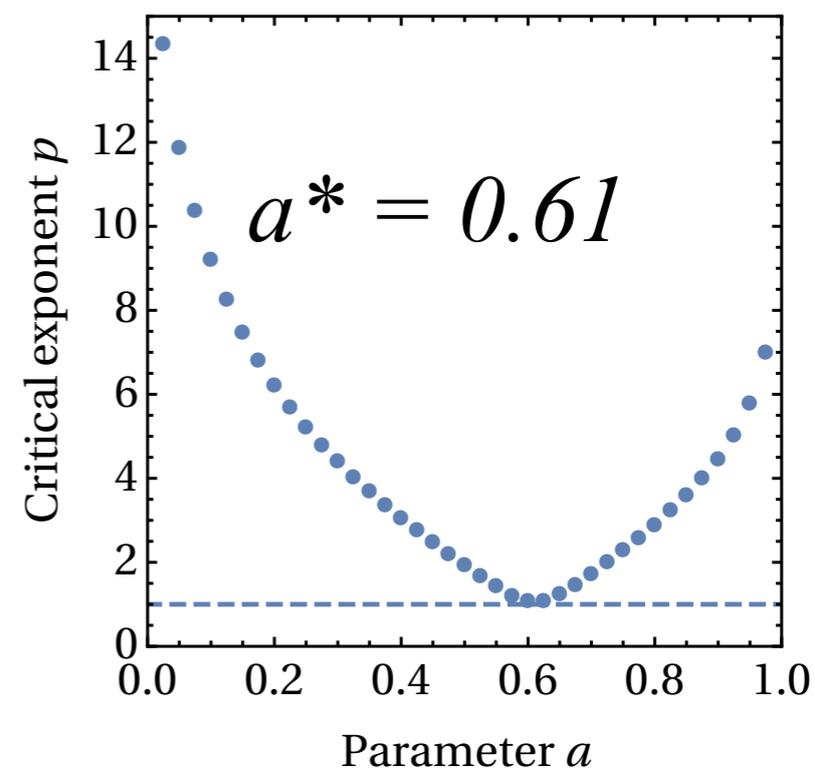
$a = 0.25$



## Correlation length



## Critical exponent



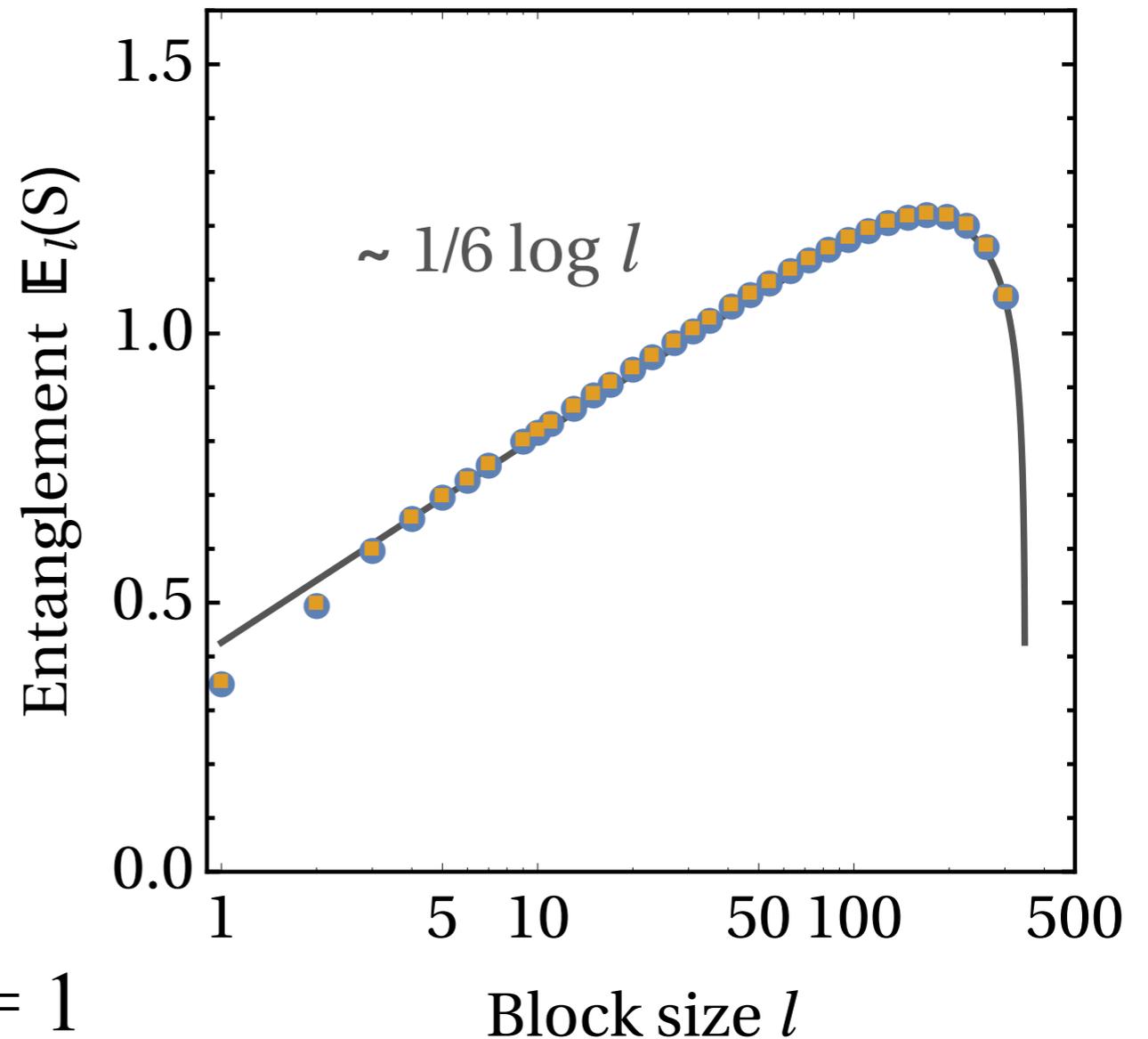
# Ising CFT entanglement

**Blue:** flat tiling  
at  $a = 0.58$

**Orange:** hyperbolic tiling  
at  $a = 0.61$

**Solid:** theory for  $c = 1/2$ ,  
fit at  $\epsilon = 0.08$  (in lattice units)

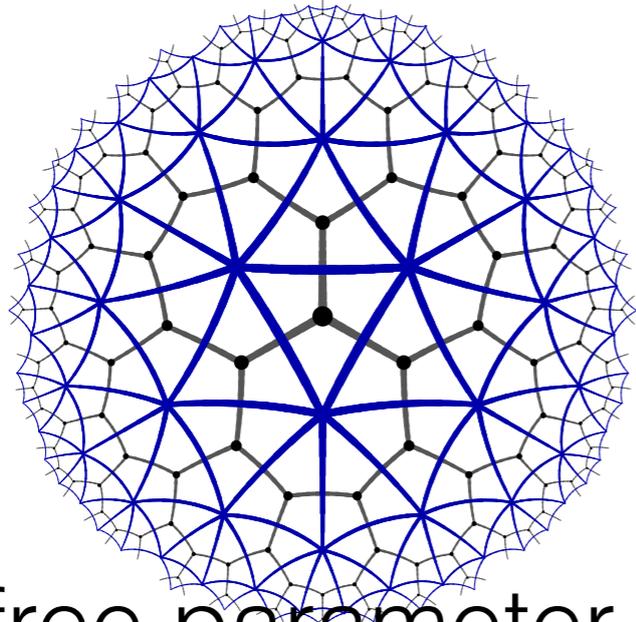
cutoff =  $\epsilon \neq$  lattice spacing = 1



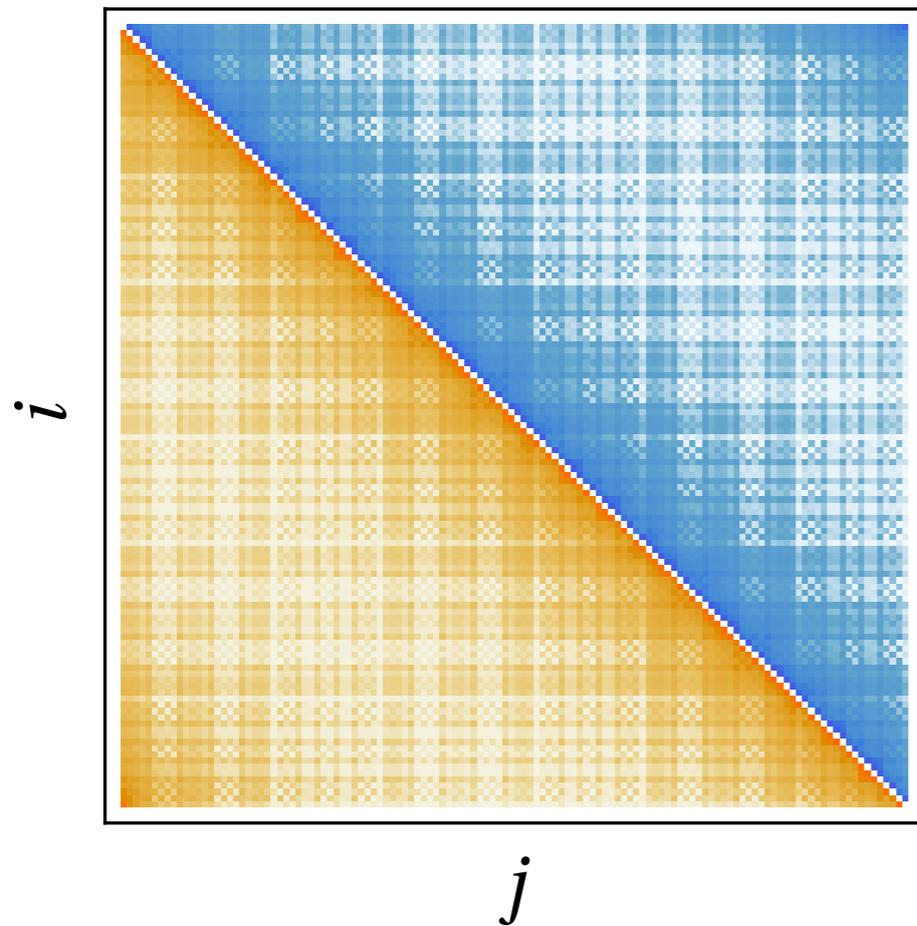
$$S_\ell = \frac{c}{3} \ln \left( \frac{L}{\pi \epsilon} \sin \frac{\pi \ell}{L} \right) \simeq \frac{c}{3} \ln \frac{\ell}{\epsilon} + O \left( (\ell/L)^2 \right)$$

# Bulk lattice breaks TI

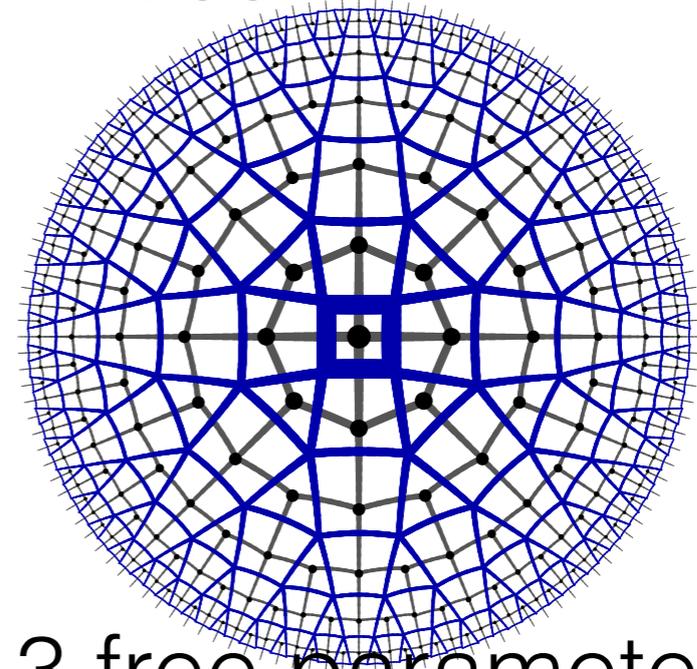
Hyperbolic  $\{3,7\}$  tiling



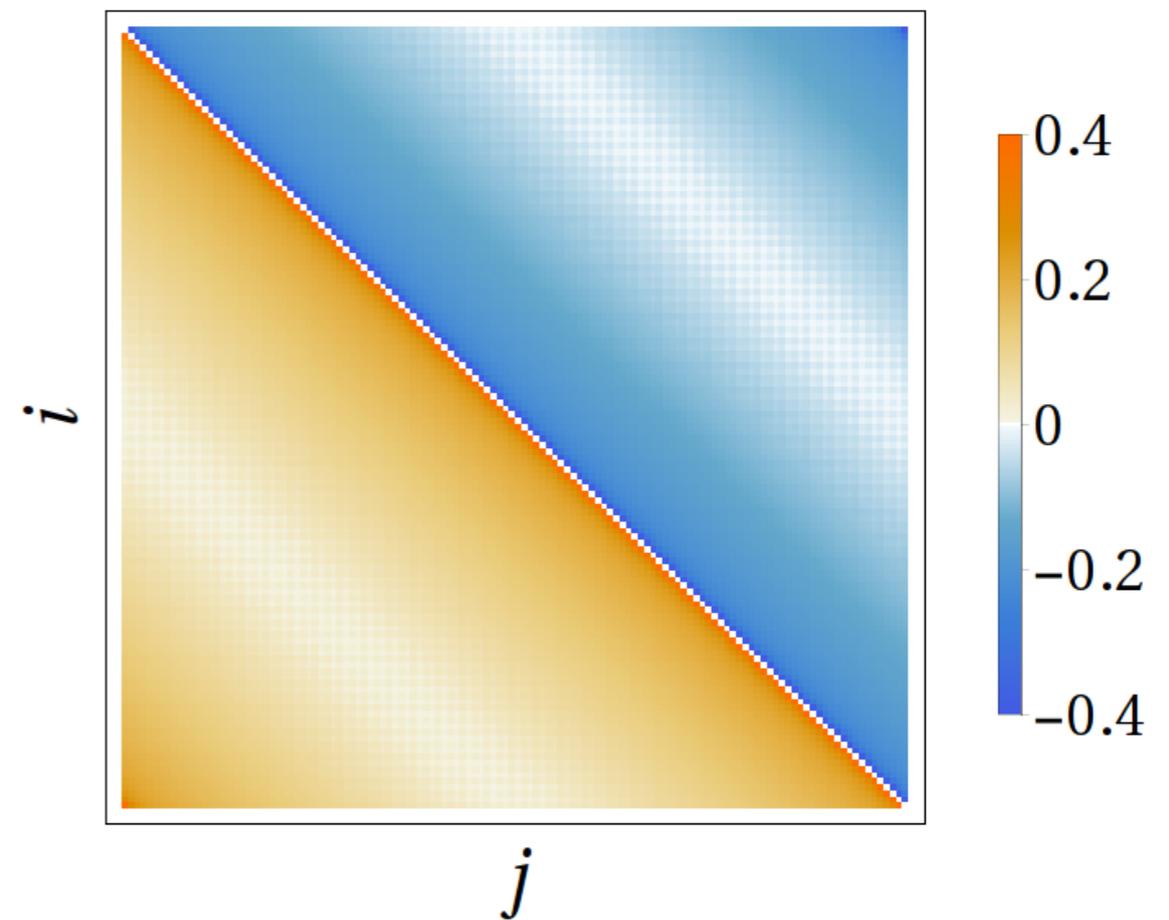
1 free parameter



Dual-MERA



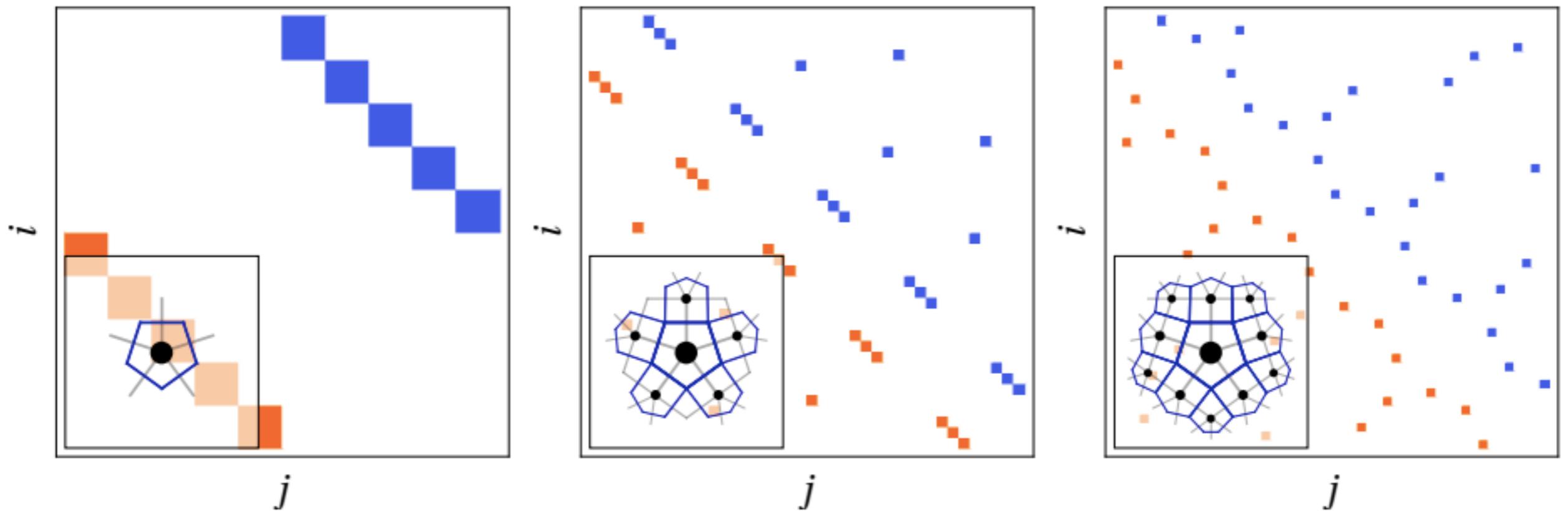
3 free parameters



# Holographic pentagon code as a majorana dimer model

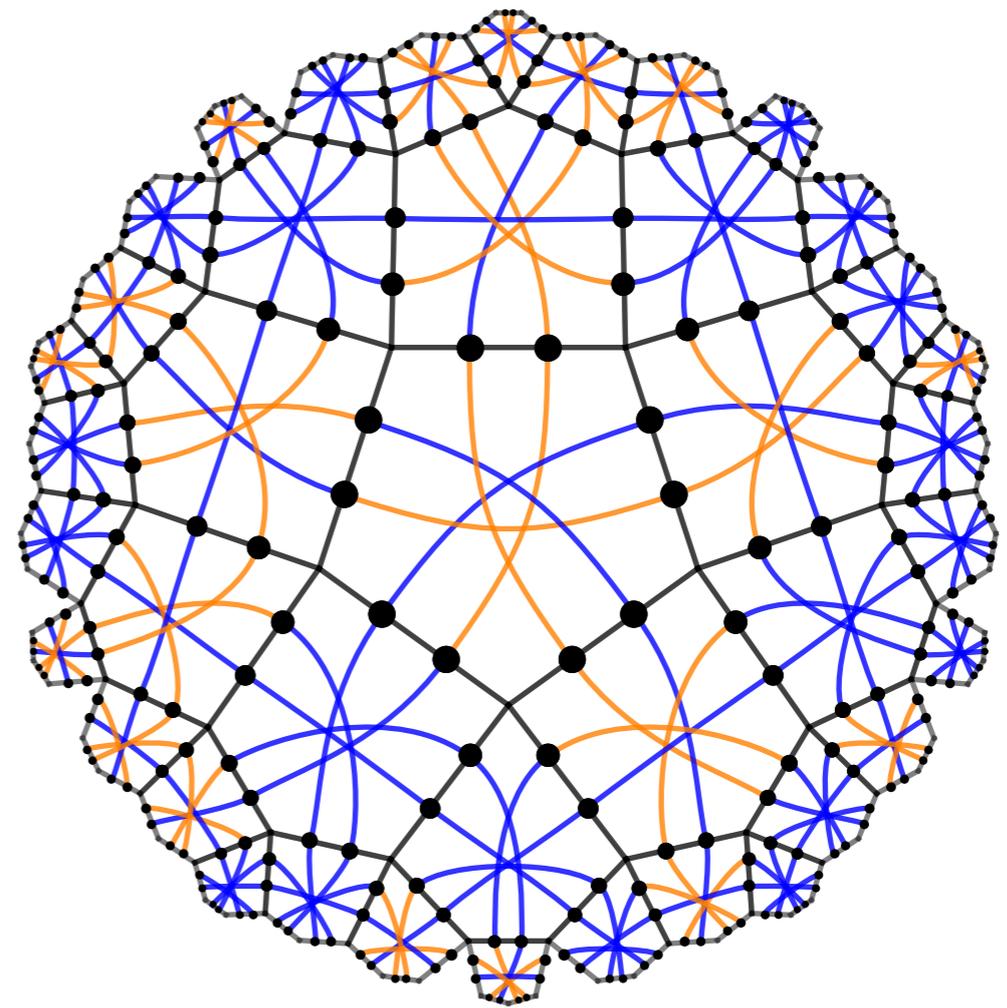
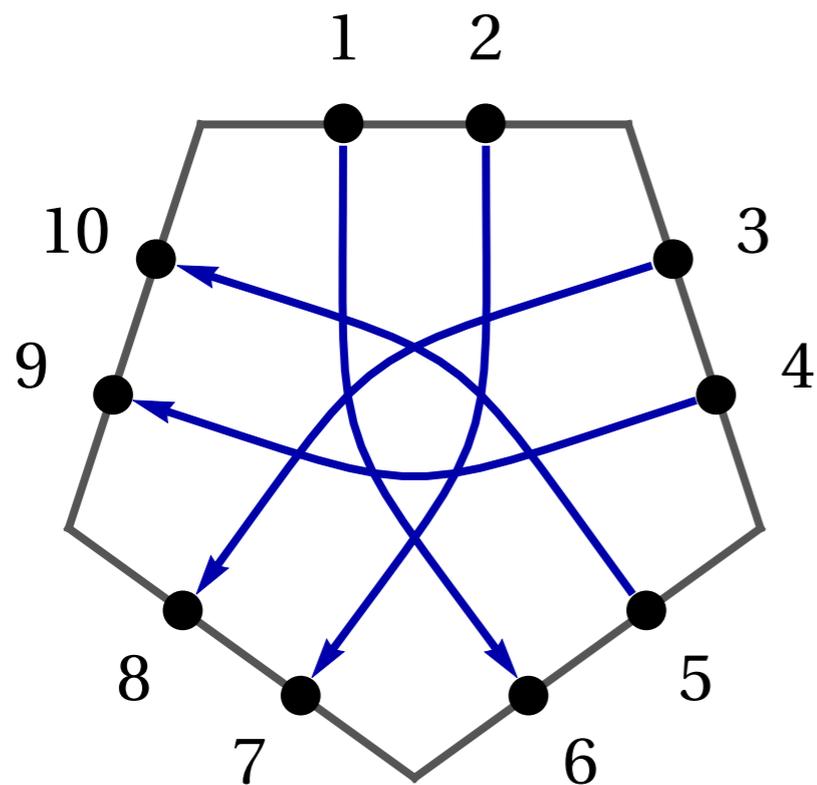
$\{0,1\}$  input on 5-qubit code yields match gate tensors.

Covariance matrix



# Geodesic tracing of $\pm 1$ majorana correlations

1 qubit = 2 majorana (Jordan-Wigner transformation)



# Stabilizer tensor networks

# Generalized Pauli group

$$X = \sum_{j=1}^p |j+1\rangle\langle j|$$

$$Z = \sum_{j=1}^p \omega^j |j\rangle\langle j|$$

$$Z^\dagger X^\dagger Z X = \omega$$

$$\omega = e^{2i\pi/p}$$

Order  $p$  unitary ops.  $X^p = Z^p = 1 = X X^\dagger = Z Z^\dagger$

The generalized Pauli group on  $n$  qubits is generated by the  $X$  and  $Z$  operators on all  $n$  qubits. Up to phases, it has  $p^{2n}$  elements  $p^{2n+1}$  with phases.

# Stabilizer groups & states

A Pauli stabilizer group is a group, generated by commuting elements from the generalized Pauli group (and without  $\omega 1$ ).

$$\mathcal{S} = \langle S_1, \dots, S_m \rangle$$

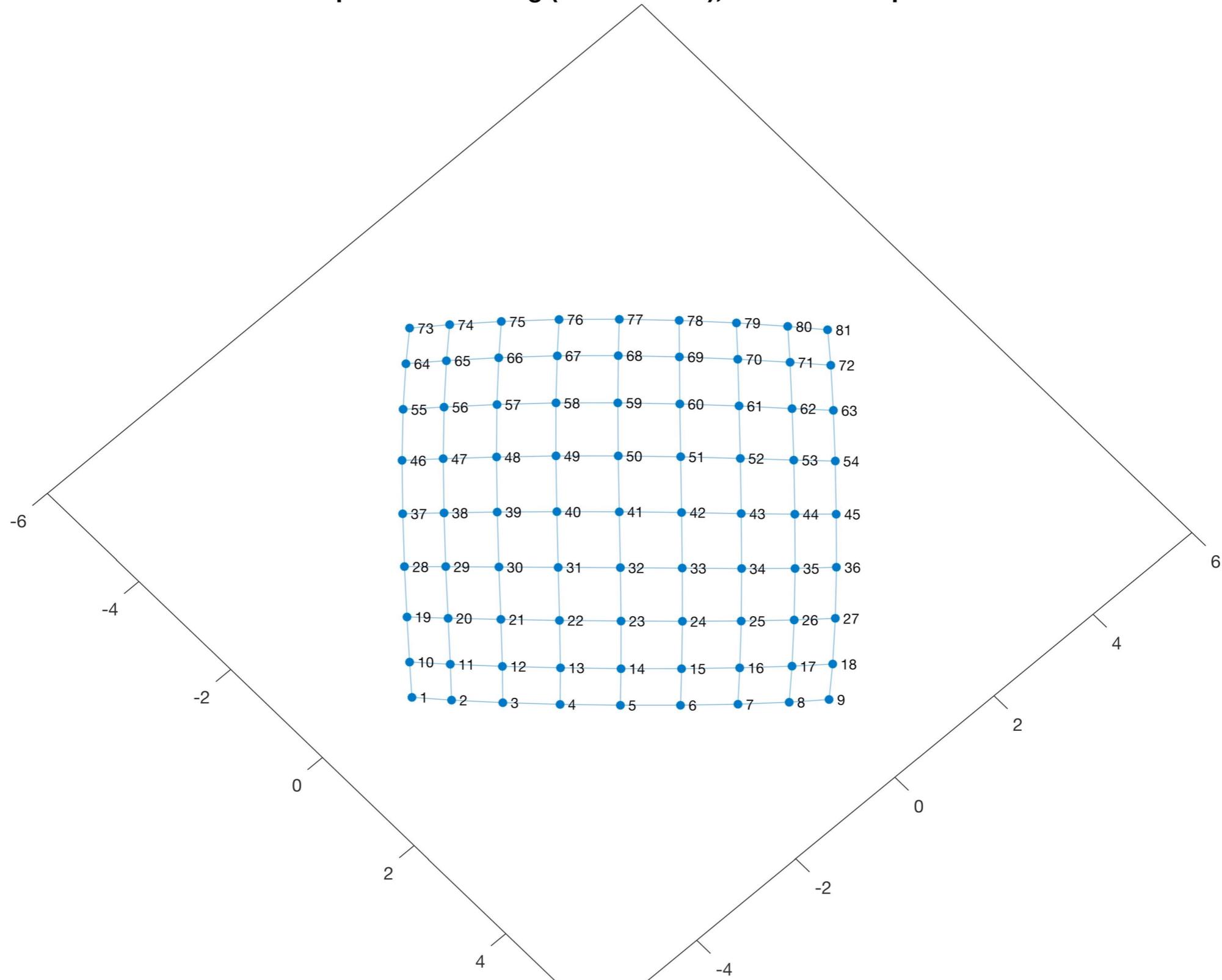
If the  $m$  generators are independent, the stabilizer group defines a  $p^{n-m}$  dimensional subspace, a unique state if  $m=n$ .

$$S_j |\psi\rangle = |\psi\rangle$$

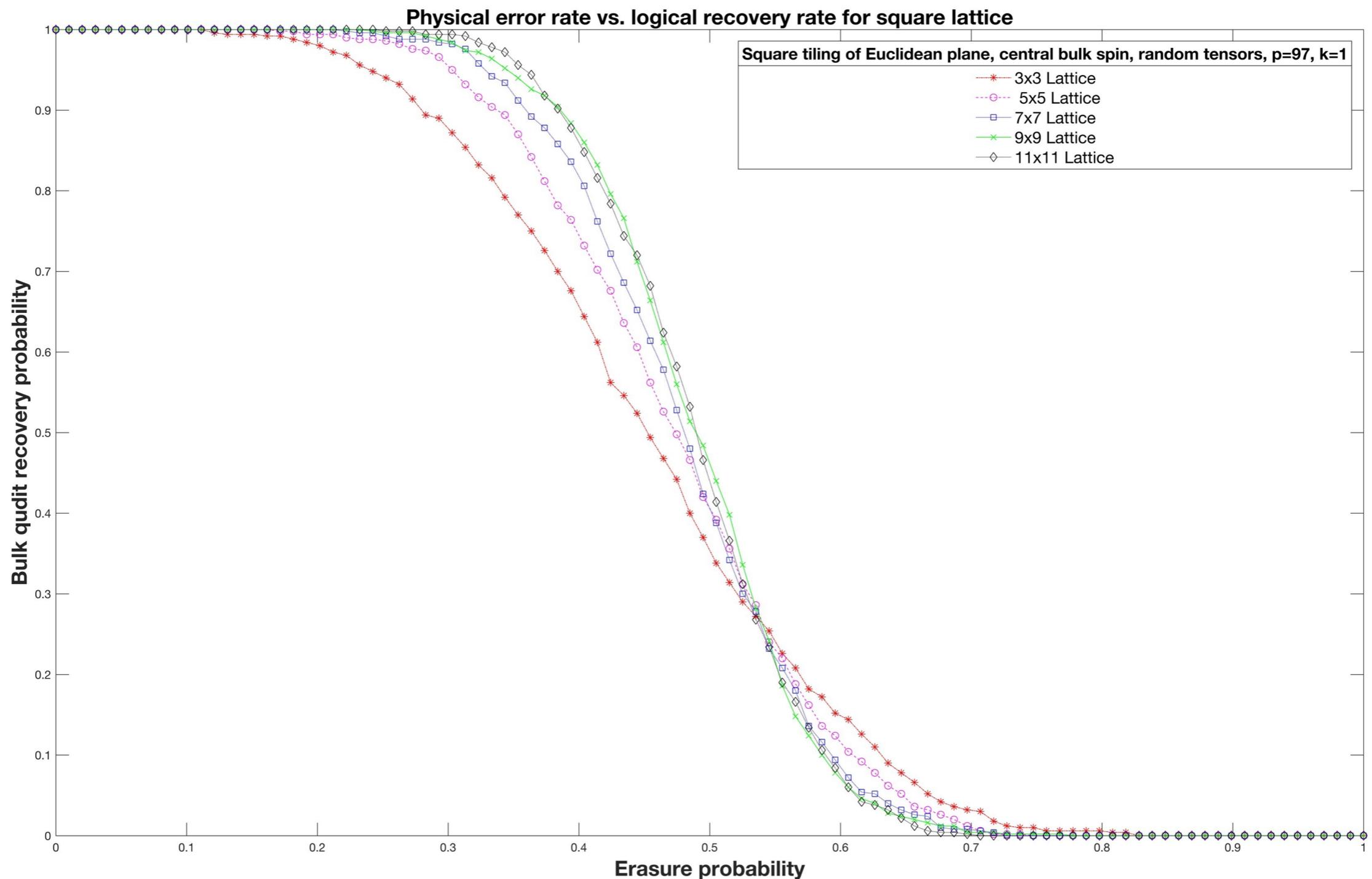
Tensors associated to stabilizer states are efficiently described and contracted. This is the content of the Gottesman-Knill theorem.

# Checking entanglement wedge hypothesis with random stabilizer tensor networks

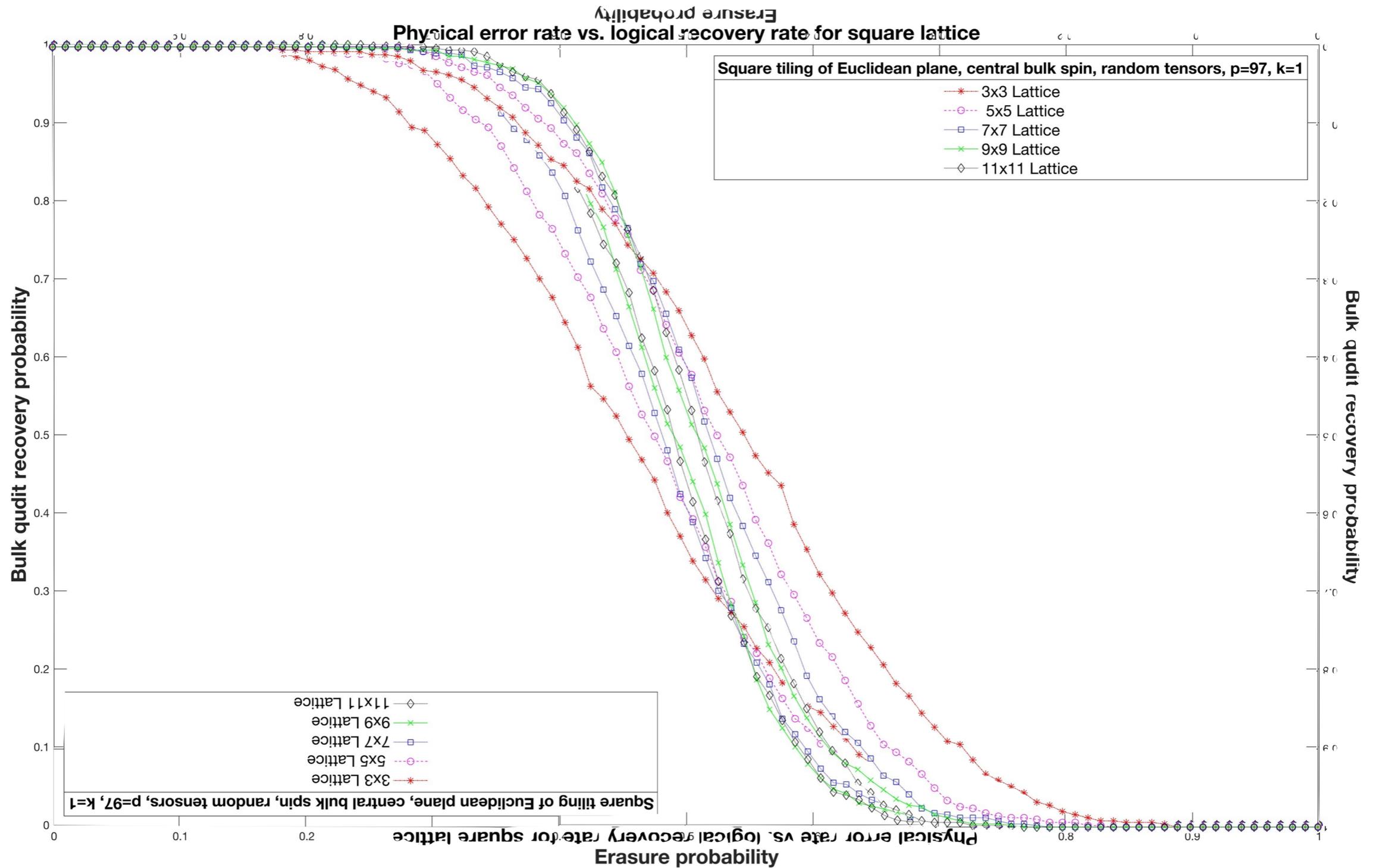
Square lattice tiling (9x9 instance), central bulk spin



# Checking entanglement wedge hypothesis with random stabilizer tensor networks

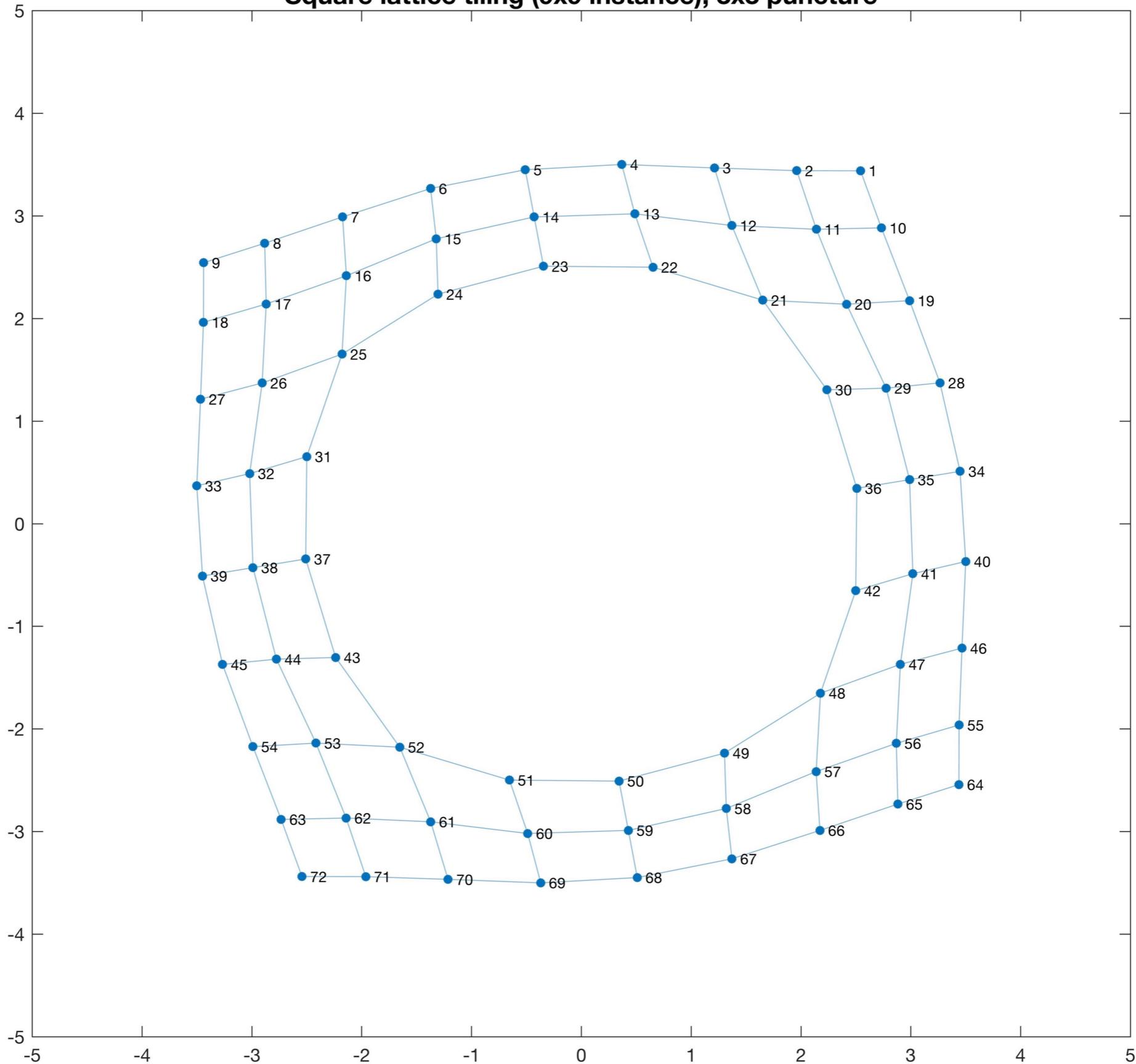


# Checking entanglement wedge hypothesis with random stabilizer tensor networks

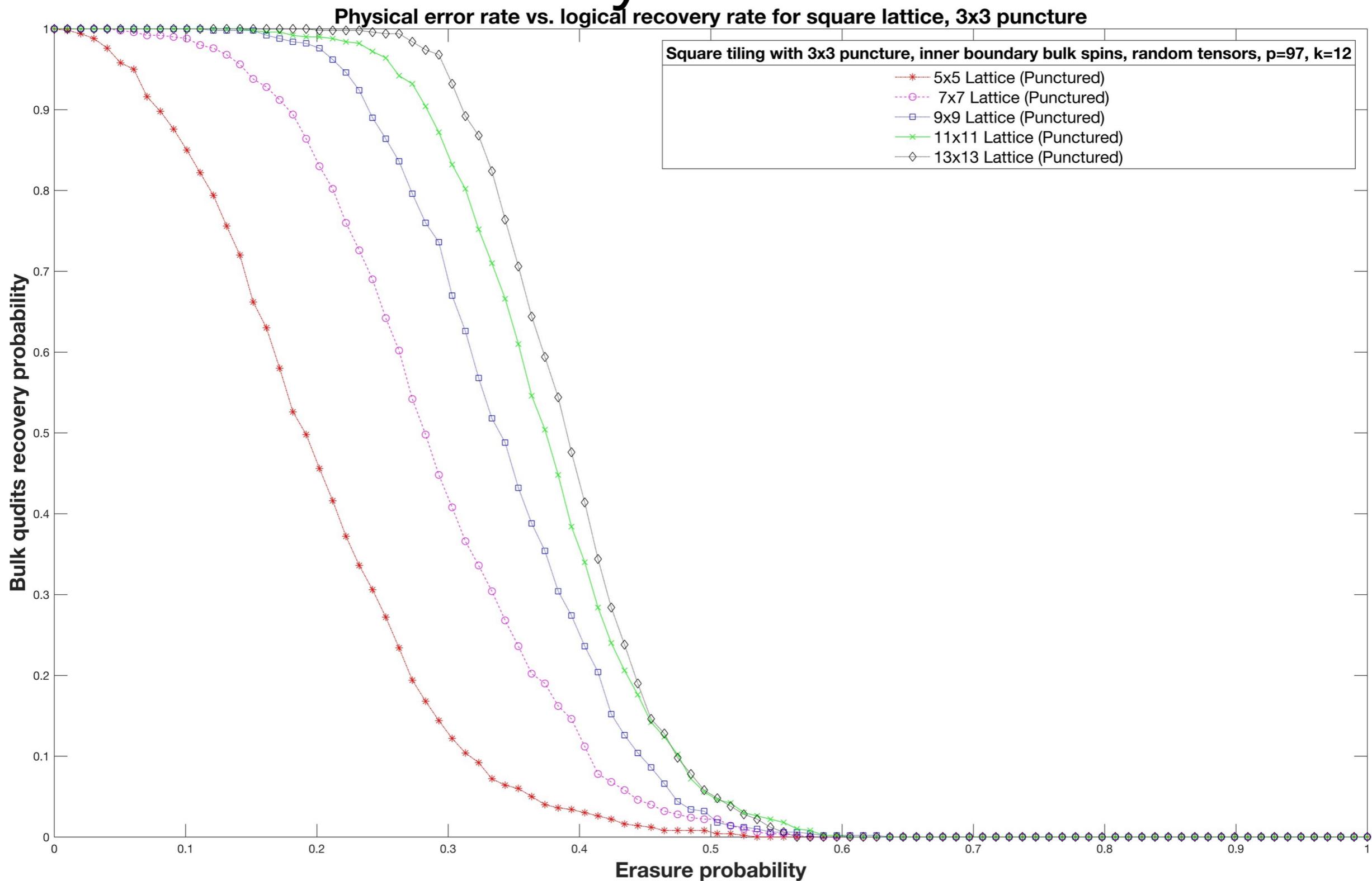


# Punching holes

Square lattice tiling (9x9 instance), 3x3 puncture



# Recovery takes a hit for boundary close to hole



# Conclusion

1. Tensor network structure does not immediately guarantee entanglement structure.
  - Fault free theory? Chaos needed ?
  - Fault bulk TI ?
2. Stabilizer TN approximate entanglement features suggested by discrete geometry in holography.
  - Approximate of the entanglement wedge hypothesis.
  - Produce synthetic entanglement structures and QECS.
3. Exactly solvable tensor networks provide a valuable tool for the study of tensor network holography.
  - What are your questions ?

Thank you and  
Thank them for the hard work



Alexander Jahn

Fermionic  
numeric



Marek Gluza

Matchgate  
formalism



Arkin Tikku

Stabilizer TNs