

Title: Fun with replicas and holographic tensor networks

Speakers: Michael Walter

Collection: Tensor Networks: from Simulations to Holography III

Date: November 17, 2020 - 9:00 AM

URL: <http://pirsa.org/20110023>

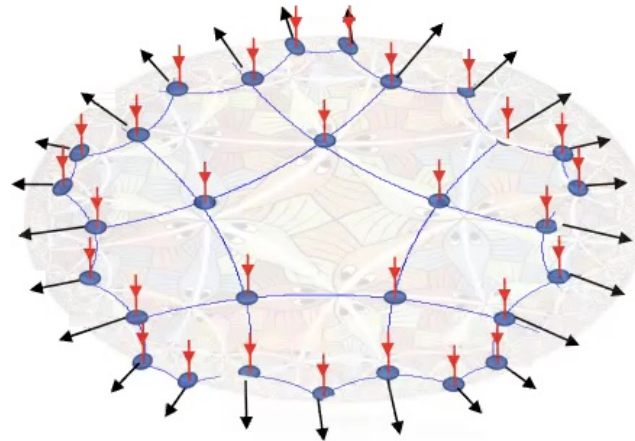


UNIVERSITY OF AMSTERDAM



# Fun with Replicas & Holographic Tensor Networks

Michael Walter



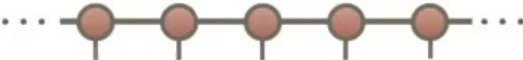
Tensor Networks Workshop, PI, 2020



# The tensor network toolbox

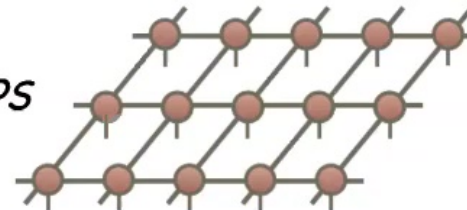
**Tensor network:** many-body state defined by contracting network of (local) tensors

$$|\Psi\rangle = \sum_{i_1, \dots, i_n} \boxed{\Psi_{i_1, \dots, i_n}} |i_1, \dots, i_n\rangle$$

e.g. *MPS* ... 

White, Fannes-Nachtergaele-Werner, Östlund-Rommer

*PEPS*



Verstraete-Cirac



Numerical tool on classical and quantum computers

Analytical tool that provides “dual” descriptions

➔ Conceptual tool to build toy models of complex phenomena

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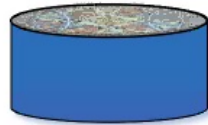
# Motivation: Holography

Susskind, 't Hooft  
Maldacena



In holography, **gravity emerges** from complex QM system

boundary: d-dim  
QM system (a CFT)



time ↑

Controlled setup to study  
quantum gravity; including  
black holes, wormholes, ...

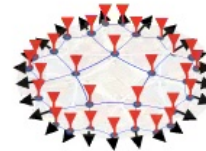
bulk: (d+1)-dim gravity (in AdS)

Understand this  
emergence **using QIT**



but also inspiration for other  
applications in QI, cond-mat, ...

Build **toy models** that  
reproduce and explain



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# Outline

Random tensor networks as a versatile toy model of holography.

Key tool: “Replica trick”. Explains many interesting features by mapping to simple classical stat mech models.

Three “advanced” features that connect to recent developments:

1. Non-perturbative corrections to the entropy
2. Quantifying entanglement
3. Holographic mapping and “islands”

based on recent joint work with Dong-Qi, Lancien, Penington-Witteveen, ...

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# Entropy

Entropy is a central quantity in quantum information theory:

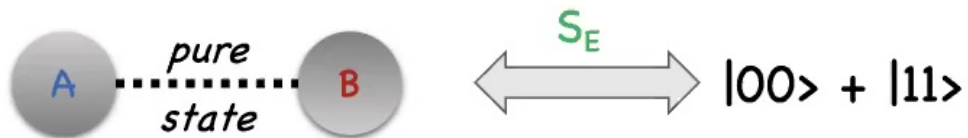
$$S(A) = -\text{tr } \rho_A \log \rho_A$$

quantum system A  
density matrix  $\rho_A$

Many interpretations and uses in optimal rates & capacities.

Entanglement entropy:

$$S_E = S(A) = S(B)$$



Mutual information:

$$I(A:B) = S(A) + S(B) - S(AB)$$

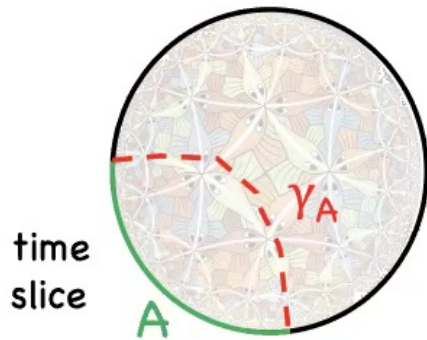
bounds  
correlations

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# Motivation: Entropy in holography

In holography, there is a remarkably simple formula for entropies:  
**Boundary entropies** are given by areas of **bulk minimal surfaces**.



$$S(A) = \frac{|\gamma_A|}{4G} + \dots$$

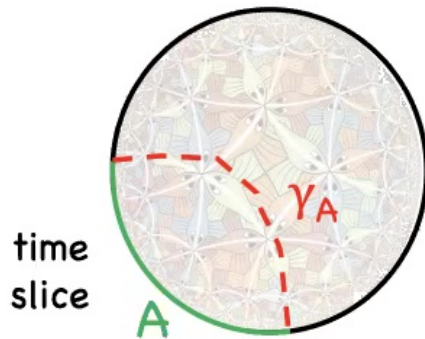
Ryu-Takayanagi (RT) law

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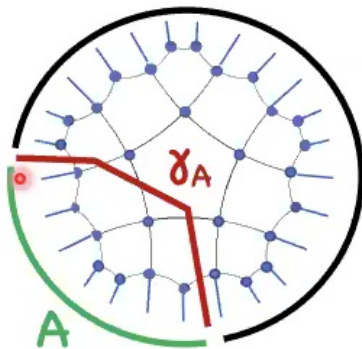


$$S(A) = \frac{|\gamma_A|}{4G} + \dots$$

Ryu-Takayanagi (RT) law

Mysterious? A very similar bound holds in tensor networks!

Swingle



$$S(A) \leq N |\gamma_A|$$

N qubits/bond

$\gamma_A$  = minimal cut

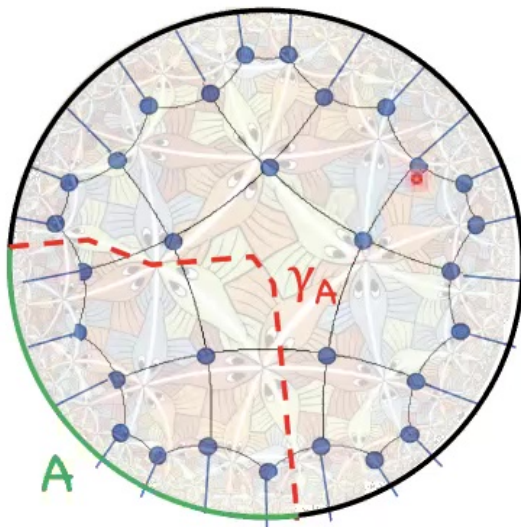
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# Holographic tensor networks

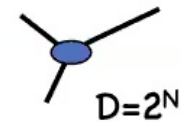
Harlow et al  
Hayden-...-W

This suggest using TNS to define “exactly solvable” toy model.



Approach: Define boundary state via **tensor network** in bulk

simple bulk tensors, e.g.  
**random tensors**



For large N **random tensor networks**,  
**Ryu-Takayanagi law** emerges:

$$S(A) \simeq N |\gamma_A| \quad \checkmark$$

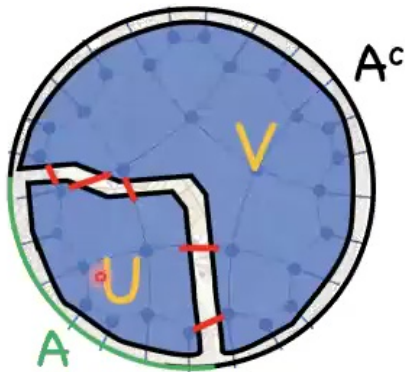
Mostly works in any geometry. By now, many variations known → **talk by Jens Eisert!**

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# Two interpretations

Harlow et al  
Hayden-...-W

1. Random tensors  $\approx$  **isometries** in any direction ("perfect tensors")

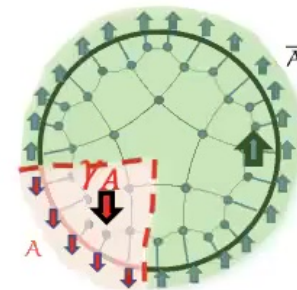


$$|\Psi\rangle =$$

N  $|\gamma_A|$  many EPR pairs

2. Disorder average  $\rightarrow$  **ferromagnetic spin model**

large N  $\rightarrow$  low T



We focus on latter interpretation, which is derived using **replica trick**.

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# The replica trick

Any **polynomial** function of state can be computed as expectation value given sufficiently many **"replicas"**:

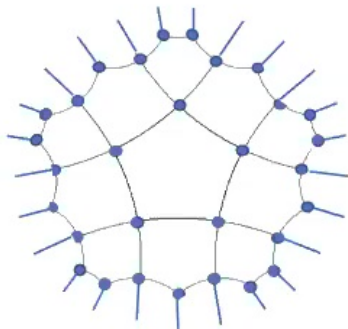
$$\text{tr}[\rho^{\otimes n}]$$

Example: Rényi entropy

$$S_n(\rho) = \frac{1}{1-n} \log \text{tr}[\rho^n] = \frac{1}{1-n} \log \text{tr}[\text{X} \rho^{\otimes n}]$$

X = cyclic permutation

How to apply to random tensor networks?



$$|\Psi\rangle = \left( \bigotimes_{\langle x,y \rangle} |\langle xy| \rangle\right) \left( \bigotimes_x |V_x\rangle \right)$$

max. entangled states      random tensors

$$|\langle xy \rangle\rangle = \sum_{\mu=1}^D |\mu, \mu\rangle$$

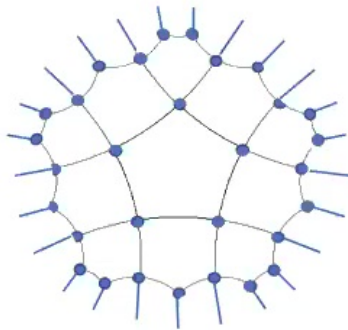
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# Replica trick in random tensor networks

Any **polynomial** function of state can be computed as expectation value given sufficiently many **"replicas"**:

$$\text{tr}[\rho^{\otimes n}]$$

For **random tensor networks**:



$$|\Psi\rangle = \left( \bigotimes_{\langle x,y \rangle} |\langle xy| \rangle\right) \left( \bigotimes_x |V_x\rangle \right)$$

max. entangled states      random tensors

Only need to know how to average random tensor!

$$\overline{|V_x\rangle\langle V_x|^{\otimes n}} \propto \sum_{\pi_x \in S_n} \pi_x$$

**Result: "Partition function" of classical  $S_n$  spin model!**

boundary conditions determined by quantity of interest

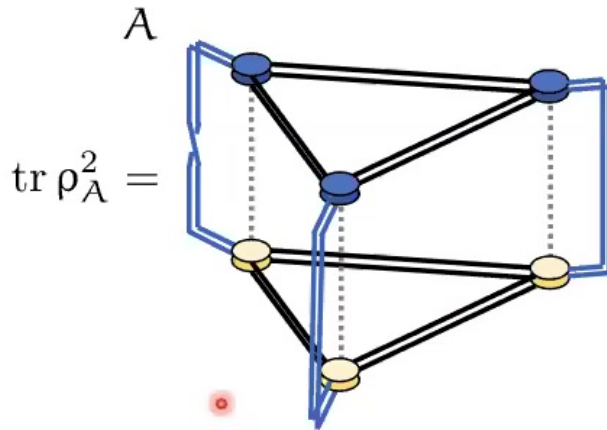
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# Replica trick for 2<sup>nd</sup> Rényi

$$S_2(A) = -\log \text{tr}[\rho_A^2]$$

$$|\Psi\rangle = \left( \bigotimes_{\langle x,y \rangle} |\langle xy| \rangle\right) \left( \bigotimes_x |V_x\rangle \right)$$

Replica trick:  $\text{tr} \rho_A^2 = \text{tr}(\rho \otimes \rho) F_A$



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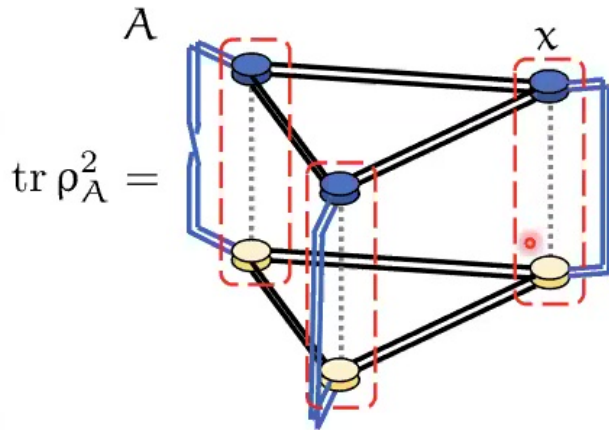


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$$|V_x\rangle \langle V_x|^{\otimes 2} =$$

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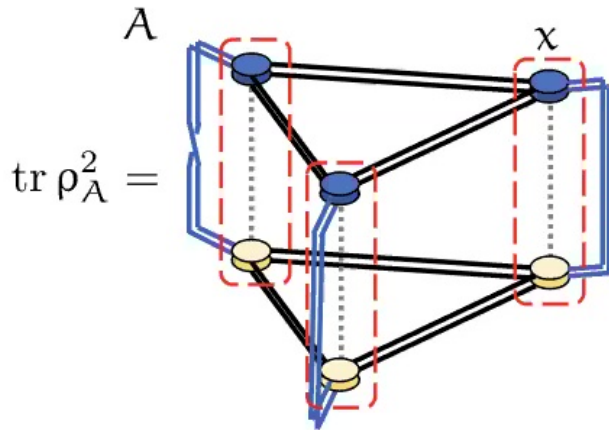


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$$\overline{|V_x\rangle \langle V_x|^{\otimes 2}} \propto$$

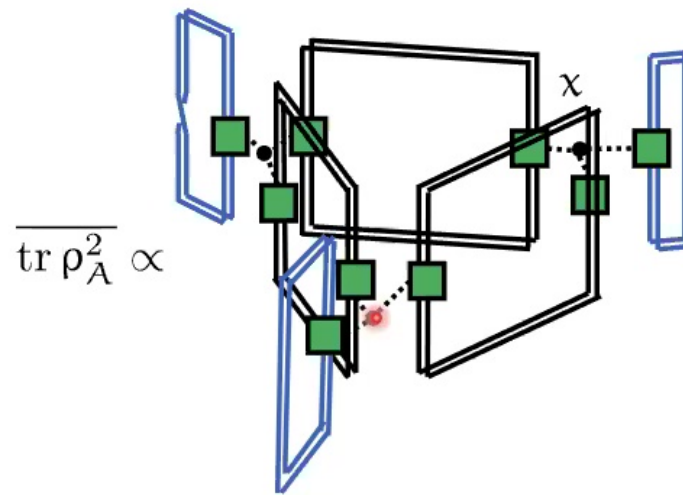
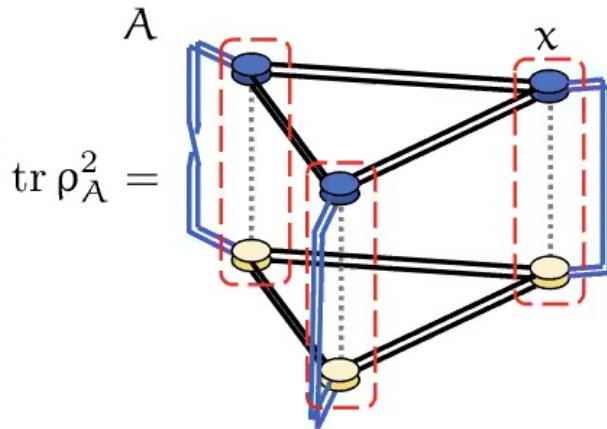
$$= I + F$$

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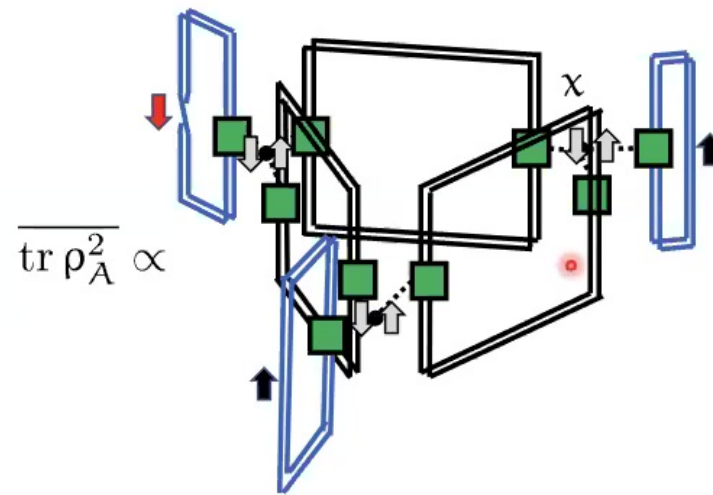
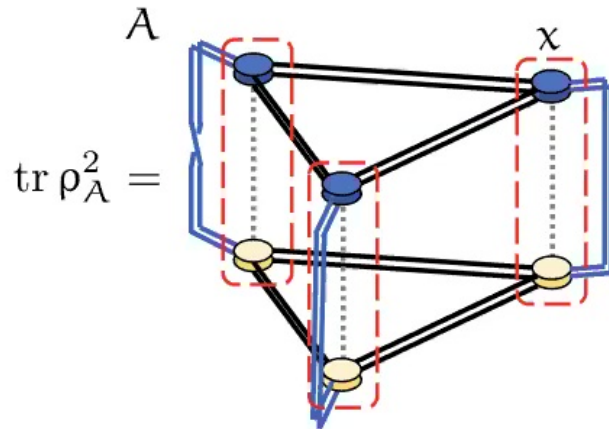
Pick I vs F at each vertex.  
Each loop is trace: factor  $D=2^N$

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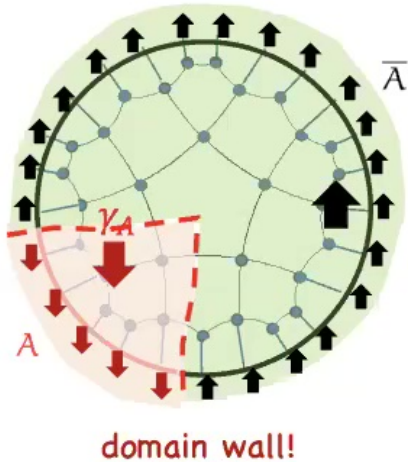


Ising variables & **boundary conditions!**

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# 2<sup>nd</sup> Rényi entropy

$$S_2(A) = \log \text{tr}[\rho_A^2]$$



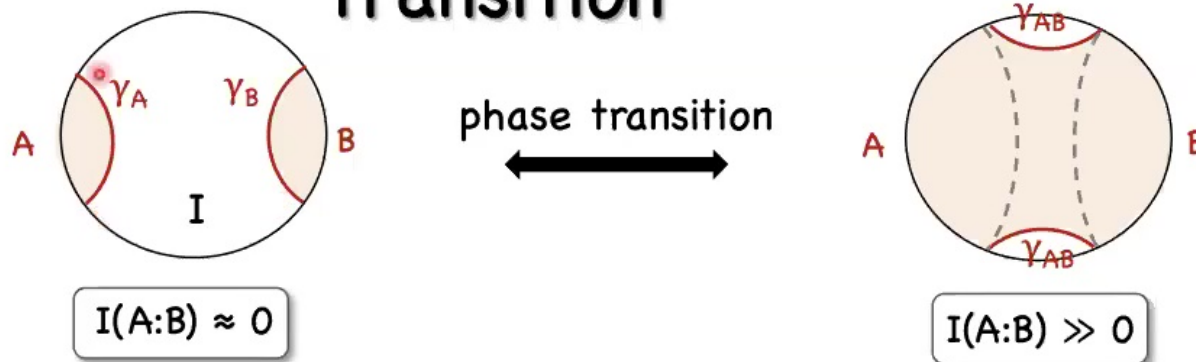
$\text{tr}[\rho_A^2] \approx$  partition function of **ferromagnetic Ising model** at  $1/T = \log(D)$

Result:  $S_2(A) \approx -\log \text{tr}[\rho_A^2] \approx \log(D) |\gamma_A|$

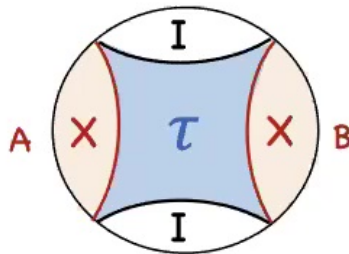
Ryu-Takayanagi formula!

# Mutual information phase transition

Penington et al.  
Lancien-W



At phase transition,  $S_n$  spin model for  $S_n(AB)$  has high **degeneracy**:



$$d(I, \tau) + d(\tau, X) = d(I, X)$$

domain wall can split in two at no cost!  
"noncrossing permutation"

Result: **Nontrivial** entanglement spectrum.

Nonperturbative corrections that do **not** vanish in large N limit!

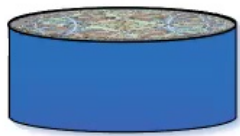
Marchenko-Pastur law

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# What does it mean?

**Random tensor networks (RTN)** provide intuitive toy model. Reproduce Ryu-Takayanagi formula (+ much more). Analyzed using **replica trick**.



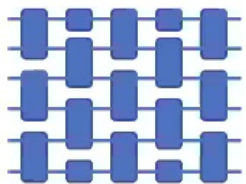
Relevance for holography? Ryu-Takayanagi formula is proved similarly. But: Einstein equations → **nontrivial** spectrum!

Is all hope lost? No! Remarkably, RTN match precisely so-called **fixed-area states** in holography.



Dong-Harlow-Marolf  
Penington et al

Moreover, general states can be expanded in terms of fixed-area states. Under certain “diagonal approximations”, can lift results!



Similarly, **random quantum circuit models** have recently been studied, exhibit interesting phenomenology. relevant to “quantum supremacy” proposals etc

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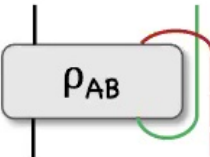
# Entanglement in holographic tensor networks

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# Partial transpose and negativity

Partial transpose:

$$\rho_{AB}^{\text{PT}} = \rho_{AB}$$


The diagram shows a rectangular box labeled  $\rho_{AB}$ . Two vertical lines extend from the top and bottom of the box. A red line starts from the top line, loops around the right side of the box, and ends at the bottom line. A green line starts from the bottom line, loops around the left side of the box, and ends at the top line. This represents the partial transpose operation where the indices of one subsystem are swapped.

If  $\rho_{AB}$  is not entangled, then this operator has eigenvalues  $\lambda_i \geq 0$ .  
Thus negative eigenvalues  $\lambda_i < 0$  diagnose entanglement.

Peres

Logarithmic negativity:

$$E_N = \log \sum_i |\lambda_i| \geq 0$$

Plenio

This is an entanglement measure. If  $E_N > 0$  then  $\rho_{AB}$  is entangled.

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# Negativity in random tensor networks

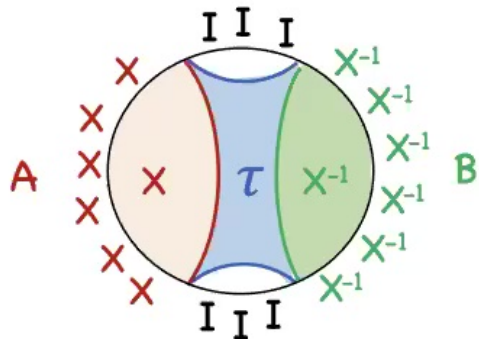
Dong-Qi-W

Approach: Compute even Rényi negativities

$$N_{2k} = \sum_i |\lambda_i|^{2k} = \text{tr} (\rho_{AB}^\Gamma)^{2k} = \text{tr} \rho_{AB}^{\otimes 2k} X_A X_B^{-1}$$

using replica trick and analytically continue to  $k=1/2$ .

Resulting statistical model has  $S_{2k}$  permutation degrees. Ground state:



$$\begin{aligned} d(I, \tau) + d(\tau, X) &= d(I, X) \\ d(I, \tau) + d(\tau, X^{-1}) &= d(I, X^{-1}) \\ d(X, \tau) + d(\tau, X^{-1}) &= d(X, X^{-1}) \end{aligned}$$

allows  $\tau$  domain to form at no cost

Interestingly, such  $\tau$  exist and we can count them! e.g.  $\tau = (1\ 2)(3\ 4) \dots$

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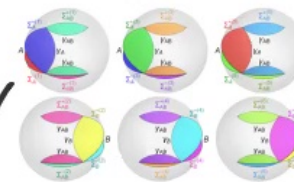
# Holographic negativity

Dong-Qi-W

In large D limit:  $E_N \approx \frac{1}{2} I(A:B) - \log(3\pi/8)$  entanglement is not maximal!

can also compute "negativity spectrum"

Relevance for holography? Similar replica trick possible to evaluate in **fixed area states**; agreement to leading order. ✓



Surprising (in both calculations): Solution is "replica symmetry breaking", i.e. does not respect  $\mathbf{Z}_{2n}$  symmetry of boundary conditions.

*How to further dissect entanglement of holographic states?*

Nezami-W  
Cui-...-W

*Other interesting "permutation observables"?*

$$\text{tr } \rho_{ABC}^{\otimes n} \pi_A \pi_B \pi_C$$

Penington-W-Witteveen

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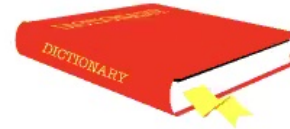
# Holographic mapping and “islands”



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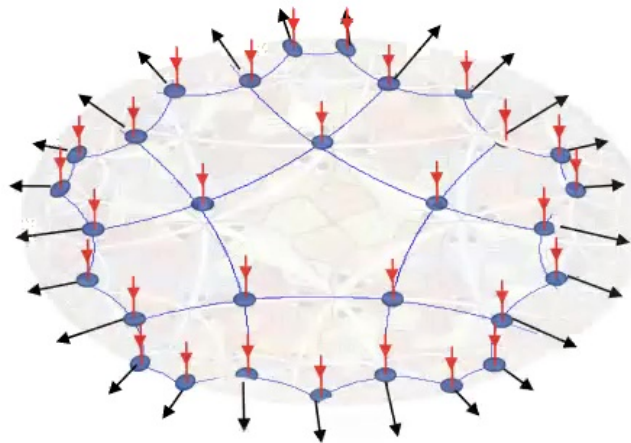


# Holographic mappings



AdS/CFT is duality between two theories = “dictionary” that maps states & observables. How to incorporate into toy model?

Approach: Define bulk-boundary mapping via tensor network



red legs: bulk degrees  
black legs: boundary degrees

“logical” bulk states are encoded in  
“physical” boundary Hilbert space

Toy model of how bulk quantum fields get encoded in CFT.

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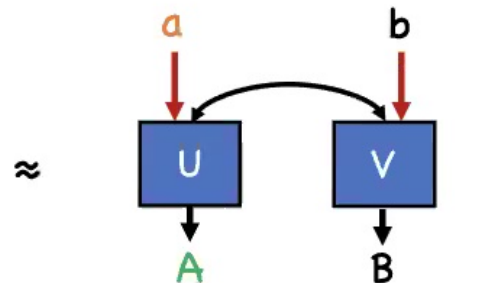
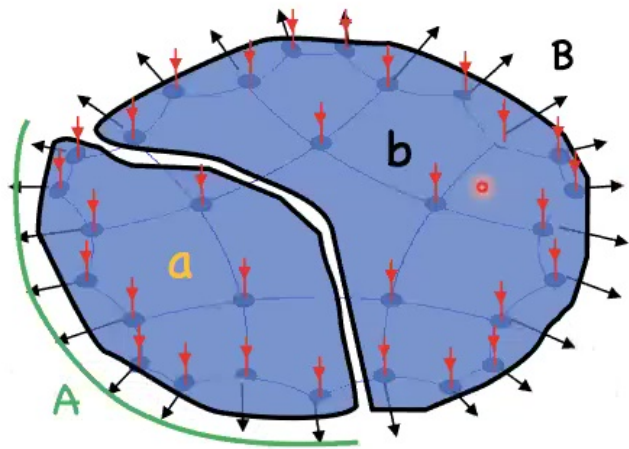




# Holographic codes



If bulks legs have small dimension  $d \ll D$ , obtain error correcting code that satisfies “**subregion duality**”, a key QI feature of AdS/CFT:



...for **isometries**  $U, V$ .

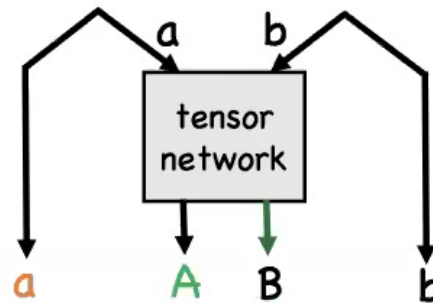
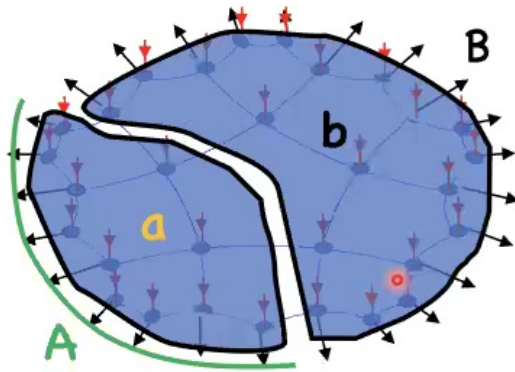
Bulk degrees of freedom in **a** (b) get encoded into **A** (B)! ✓

In particular, bulk corrections to entropy:  $S(\mathbf{A}) \approx N |\gamma_{\mathbf{A}}| + S(\mathbf{a})$  ✓

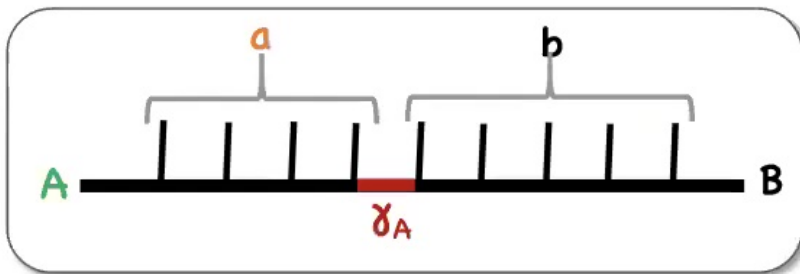
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# Subregion duality from decoupling

By decoupling, suffices to prove that  $I(a:bB) \approx 0$  in Choi state:



Schematically:



$$S(a) = \log(d) |a|$$

$$S(bB) = \log(D) |\delta_A|$$

$$S(abB) = \log(D) |\delta_A| + \log(d) |a|$$

Assume bulk legs have small dimension  $d \ll D$ .

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# Quantum minimal surfaces and islands

What if bulk entropy is not small?

$$S_2(A) \simeq \min \{ N |Y_A| + S_2(a) \} \quad \checkmark$$

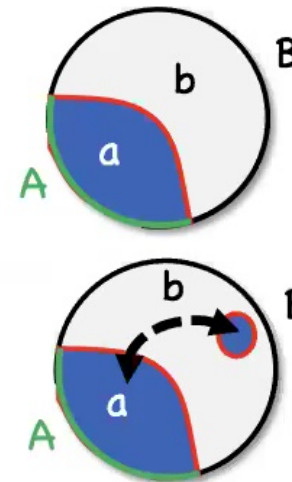
"Quantum minimal surface", minimizes "generalized entropy".

Proof using replica trick (additional action from bulk state)!

E.g., if we add highly entangled state between distant bulk sites, obtain "island" disconnected from boundary.

Holographic counterparts feature crucially in very recent developments on **black hole information paradox** that seek to give a bulk picture of black hole evaporation.

Surprising that the simple RTN model reproduces these features!?

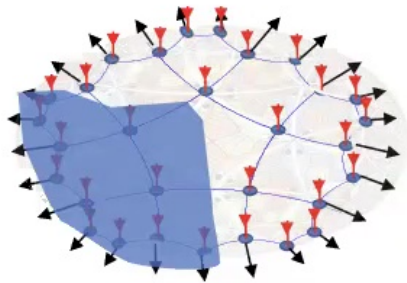


Penington  
Almheira et al

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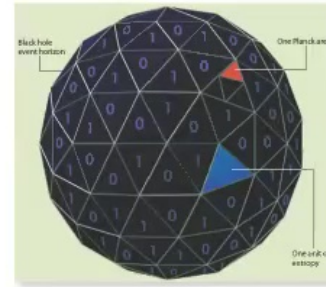
# Summary

**Holography** offers remarkable connection between geometry and entanglement.



fixed area states

Tensor networks offer **tools, models, mechanisms**.  
**RTN** versatile & easy to analyze via **replica trick**.



Ongoing research to exploit connections.

Motivation ranges from trying to understand the **emergence of space-time** from quantum mechanics to learning how dualities can help simulate **complex quantum systems** on (quantum) computers...

*Thank you for your attention!*

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