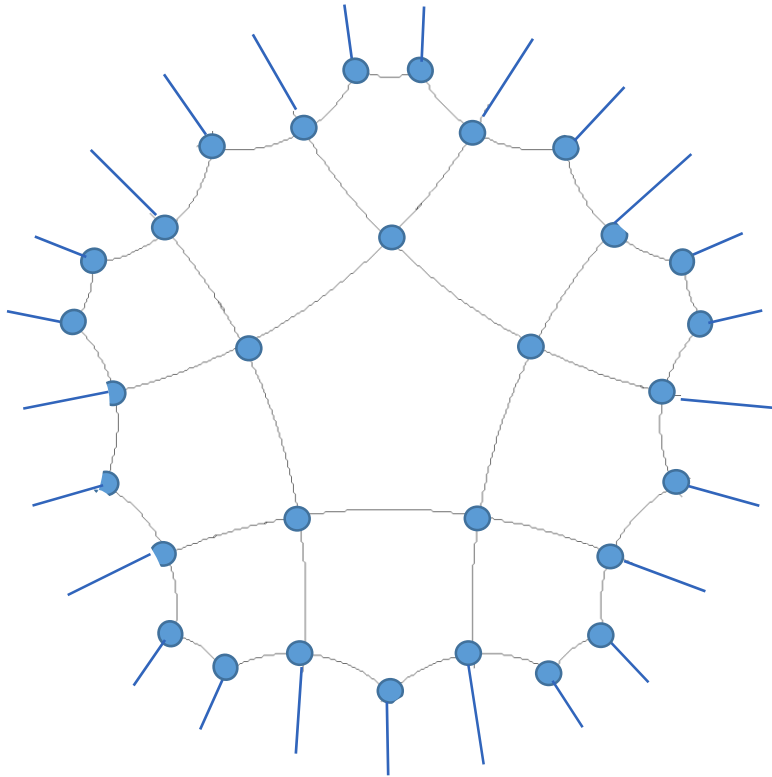


Random tensor networks & holographic duality

Michael Walter
Stanford University

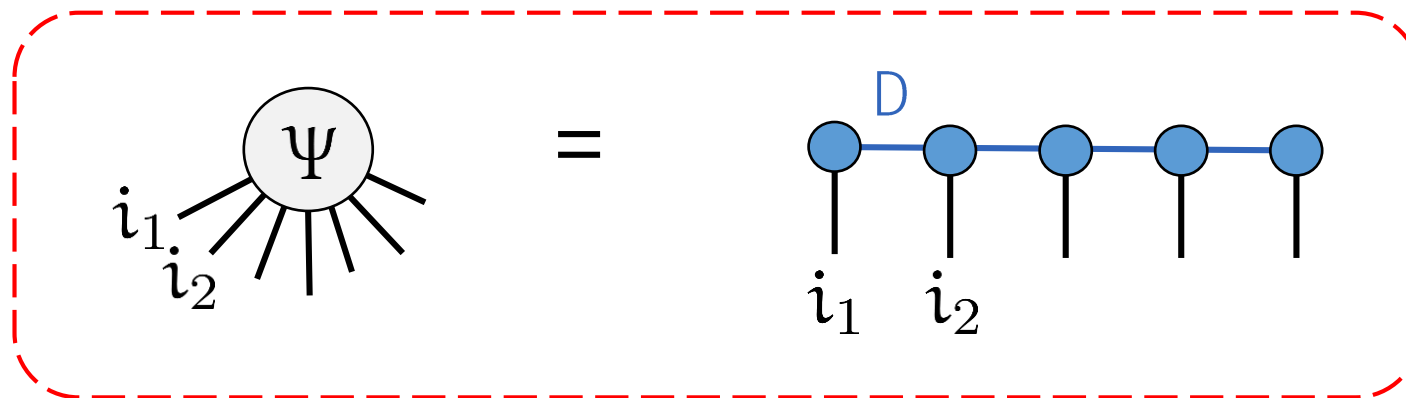
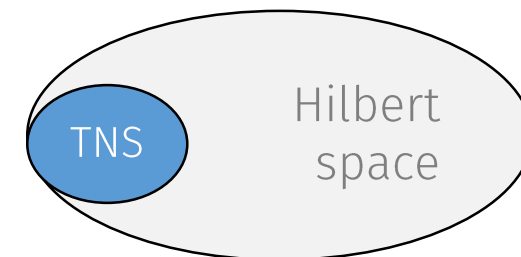
joint with P. Hayden, S. Nezami, X. Qi, N. Thomas, Z. Yang



Condensed Matter Theory Seminar, Cologne - March 2016

Tensor network states

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



example: matrix product state

Efficient variational classes & useful theoretical formalism

*ground states of
quantum matter*

quantum phases

topological order

RG circuits

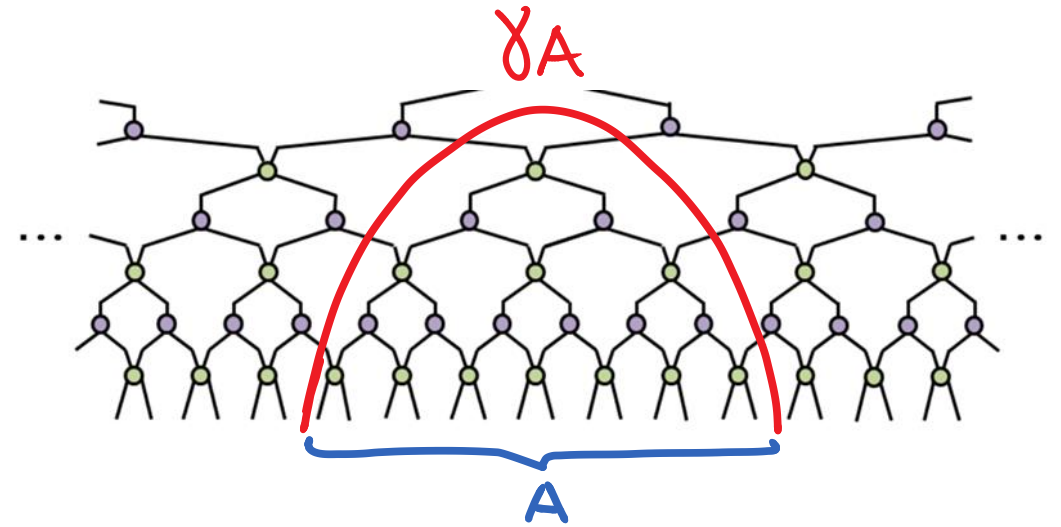
...

Tensor network kinematics (or: how to choose your corner in Hilbert space)

Fundamental bound on ent. entropy:

$$S(A) \leq \log D |\gamma_A|$$

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



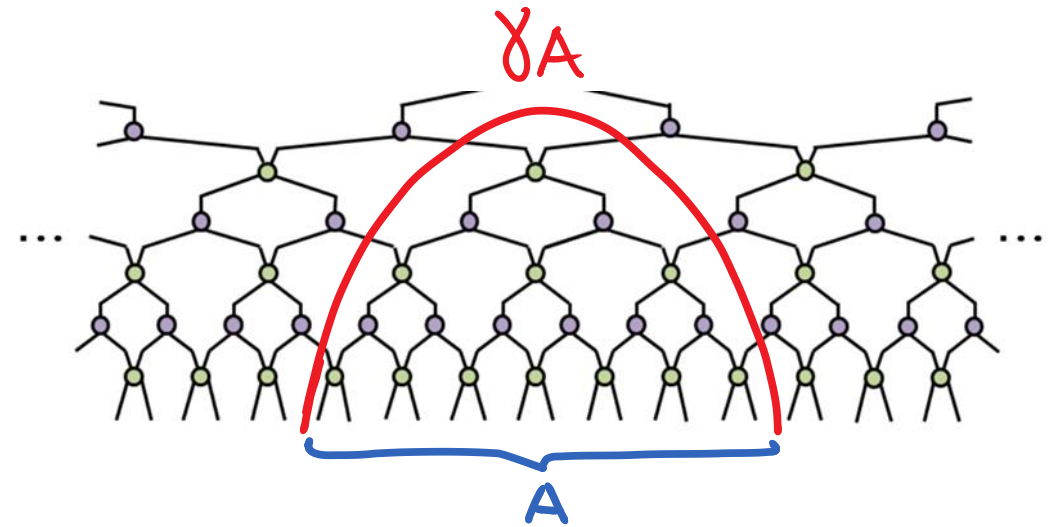
Figures from [Vidal]

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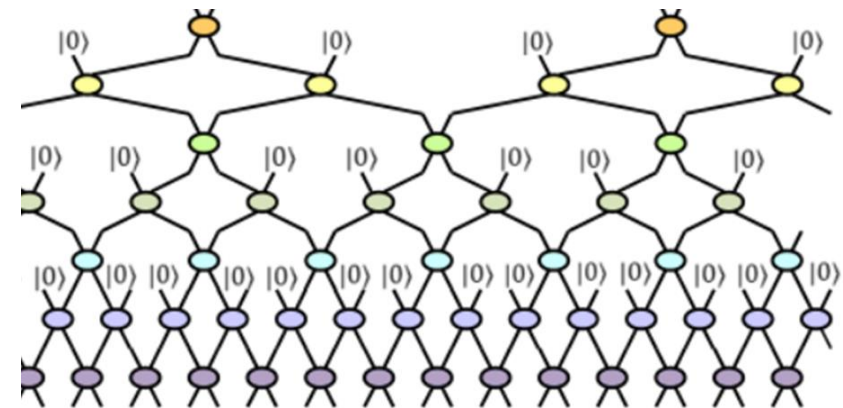
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Bulk-boundary dualities: lift physics to the virtual level, e.g.

entanglement Hamiltonian
[Cirac et al]

MERA as a RG circuit
[Evenbly-Vidal]



Figures from [Vidal]

Organization of quantum information? Properties of the bulk theory?

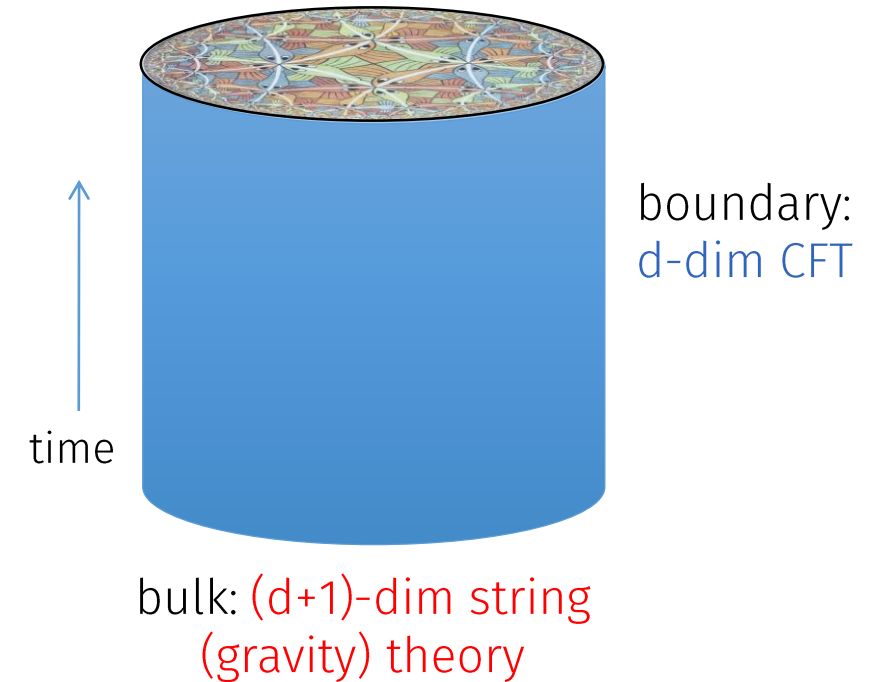
Motivation: Quantum Gravity

[Bekenstein-H.]; [Susskind], [t'Hooft]; [Maldacena]

Holographic principle: All information in a region of space can be represented as a "hologram" living on region's boundary.

$$S_{\text{BH}} = \frac{A}{4G_{\text{N}}}$$

AdS/CFT duality: conjectural realization



What is the basic **mechanism**? Fine-tuned or typical phenomenon?

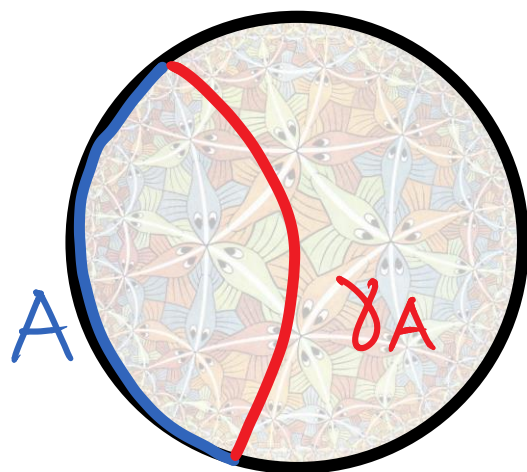
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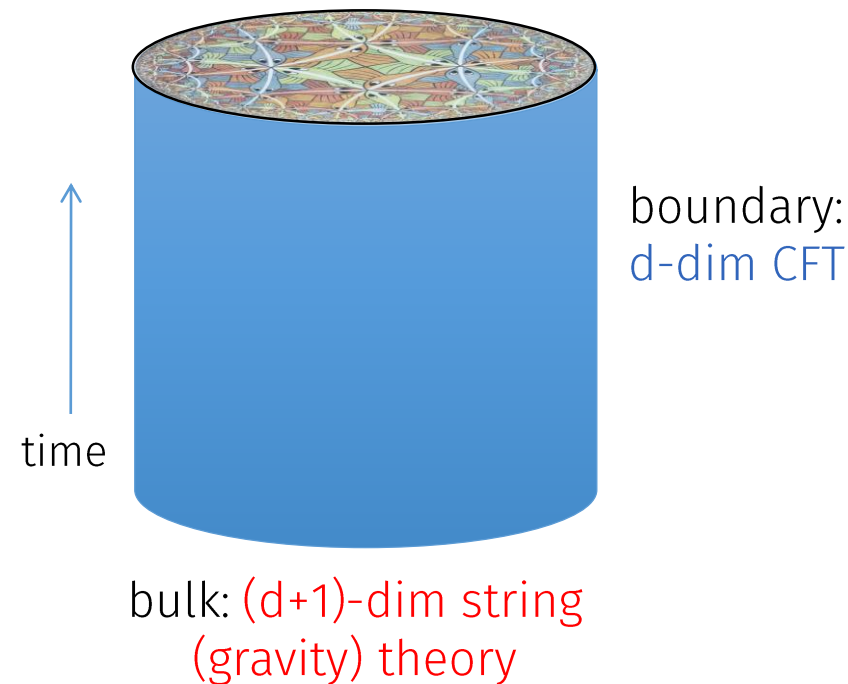
$$S_{\text{BH}} = \frac{A}{4G_N}$$

AdS/CFT duality: conjectural realization



$$S(A) = \frac{1}{4G_N} \min |\gamma_A|$$

[Ryu-Takayanagi]



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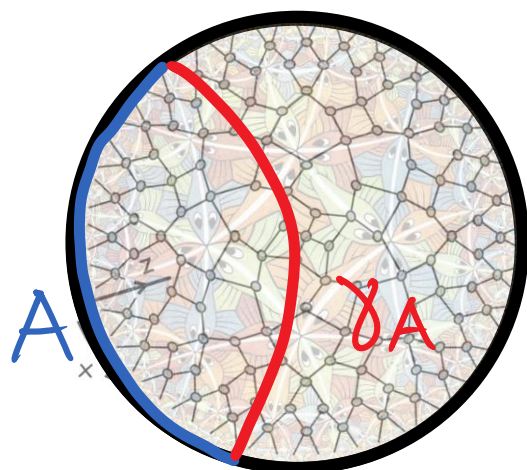
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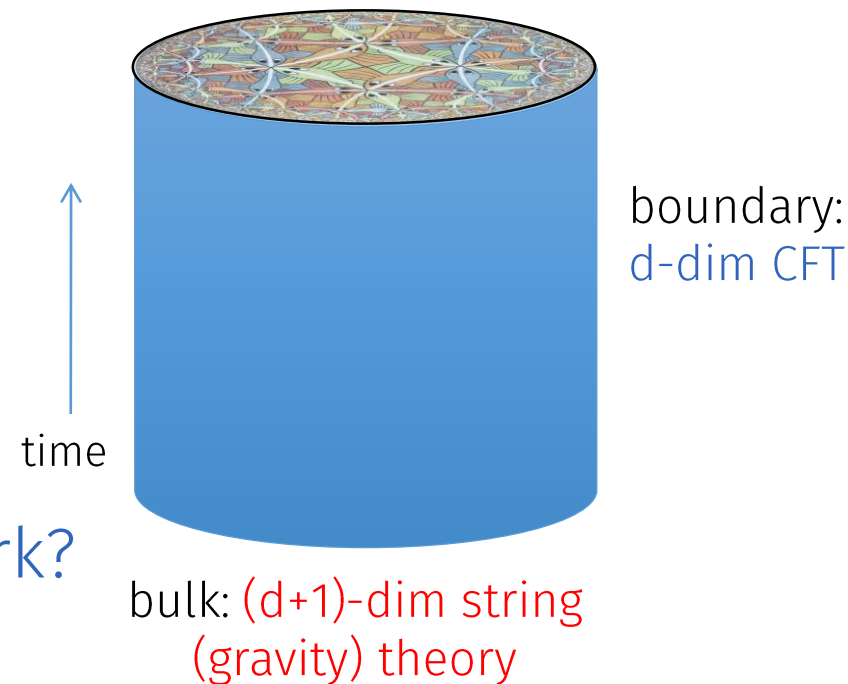


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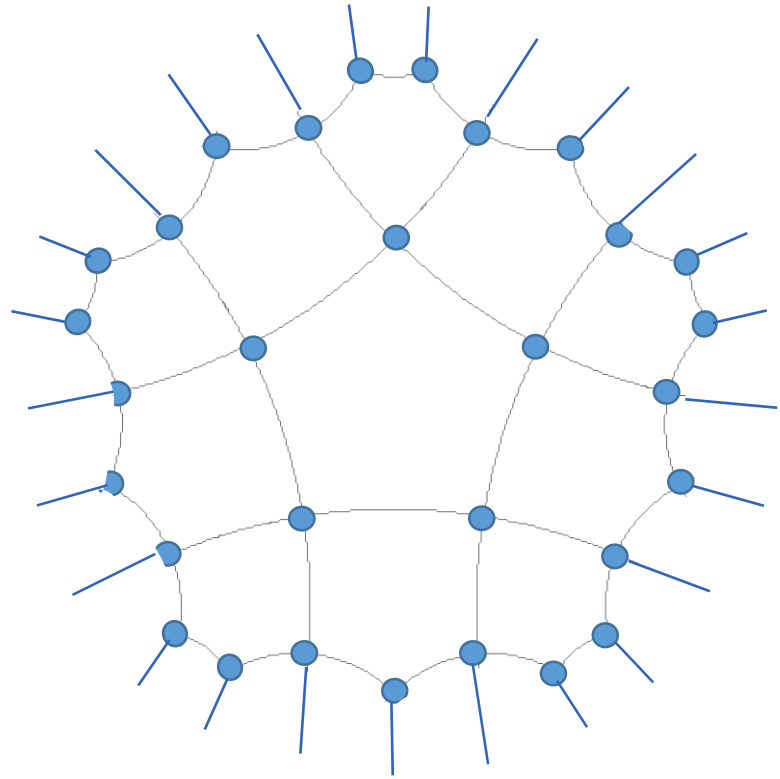
[Ryu-Takayanagi]

Space-time as a tensor network?

[Swingle]



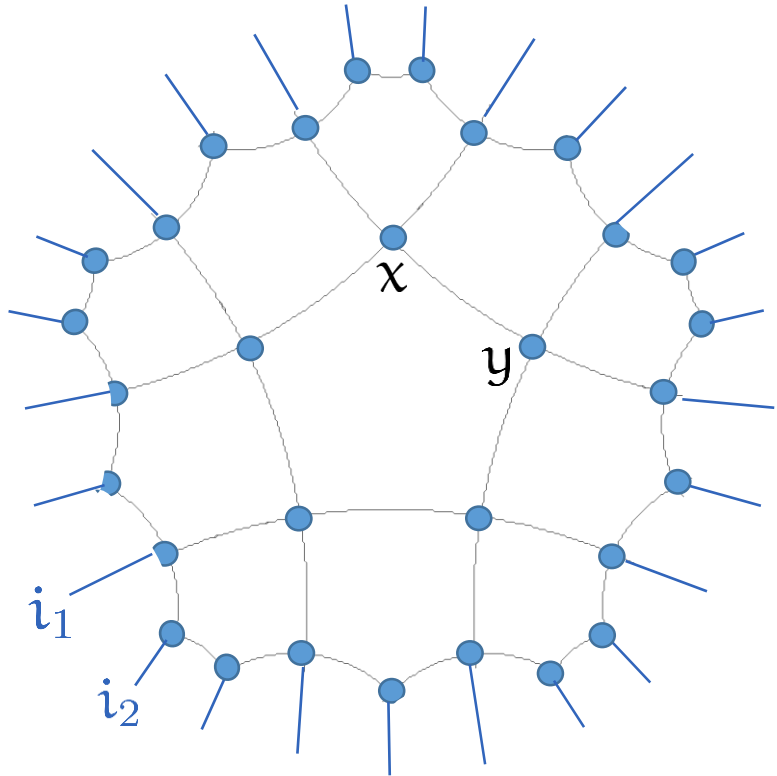
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Random tensor network states

Random tensor network states

bond dimension D

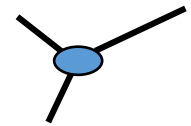


$$|\Psi\rangle = \left(\bigotimes_{\langle x,y \rangle} \langle xy| \right) \left(\bigotimes_x |V_x\rangle \right)$$

max. entangled states

random tensors

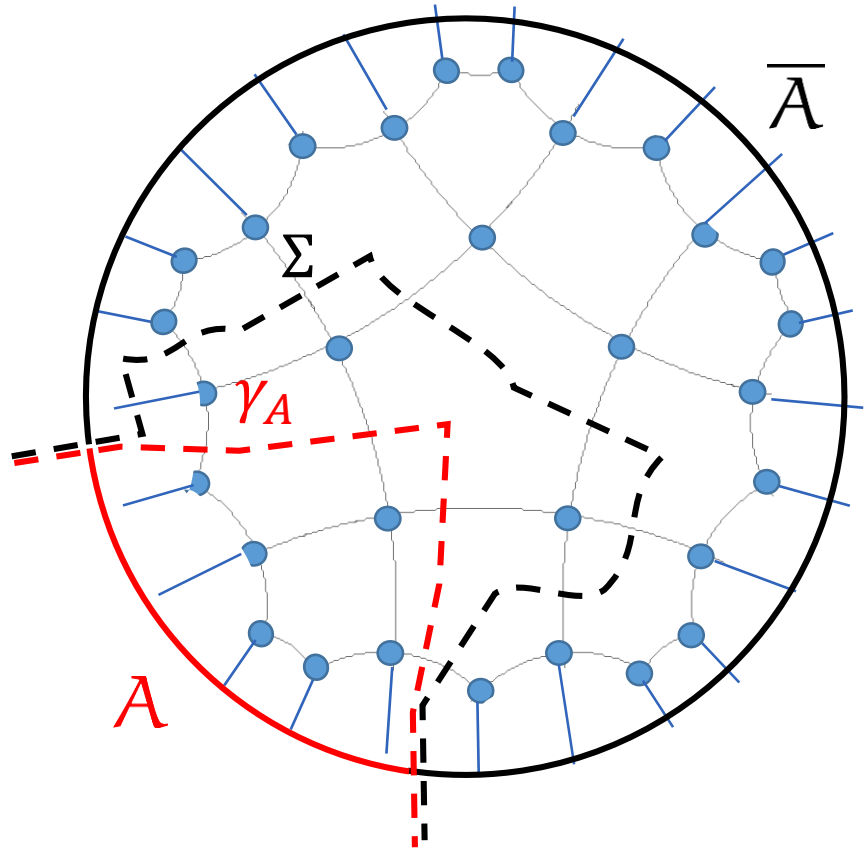
$$|xy\rangle = \sum_{\mu=1}^D |\mu, \mu\rangle$$



Random tensor network state on “boundary” of graph

Entanglement entropy

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



In any tensor network:

$$S(\mathcal{A}) \leq \log D |\gamma_{\mathcal{A}}|$$

Goal: Show that **saturated** in random tensor networks with large bond dimension D .

Strategy: Lower bound via **Renyi entropy**

$$S_2(\mathcal{A}) = -\text{tr} \log \rho_{\mathcal{A}}^2$$

Calculation of Renyi entropy

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

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

Replica trick:

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

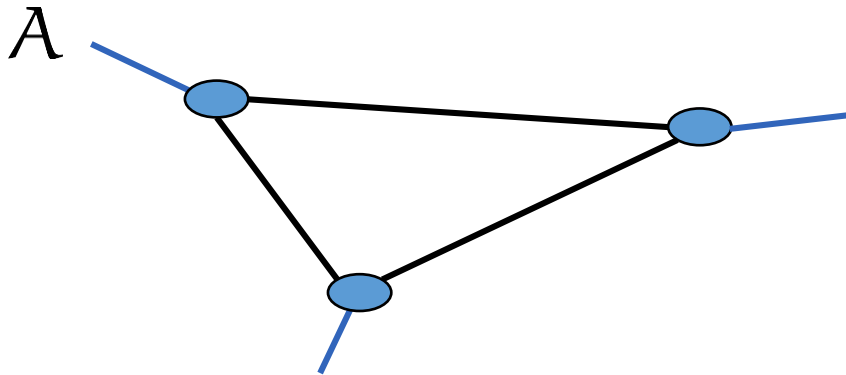
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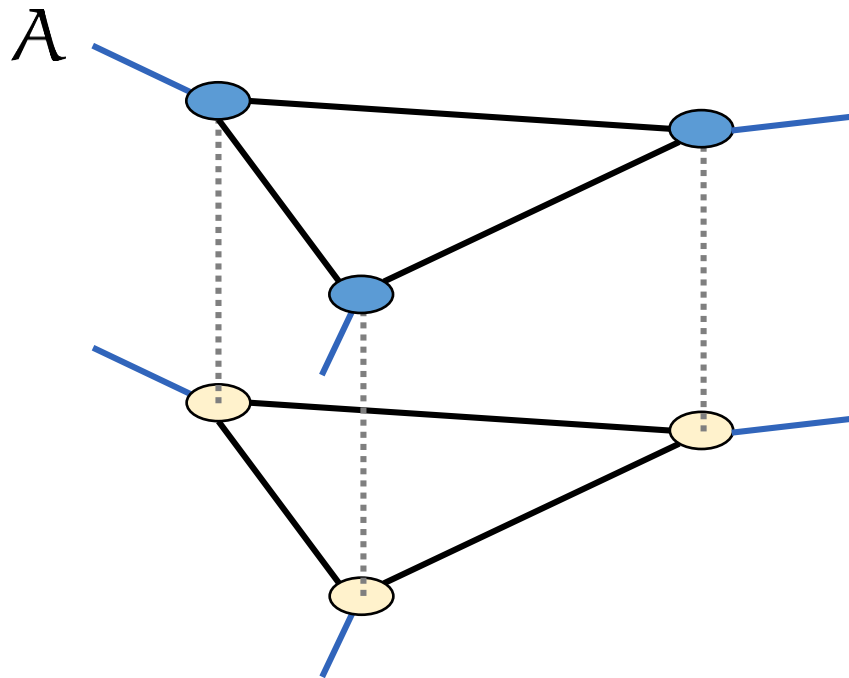
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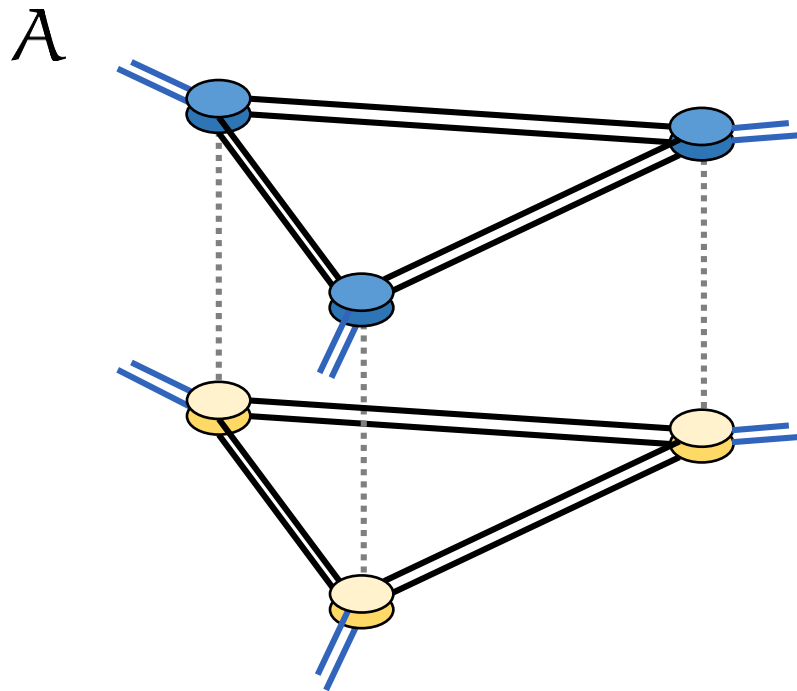
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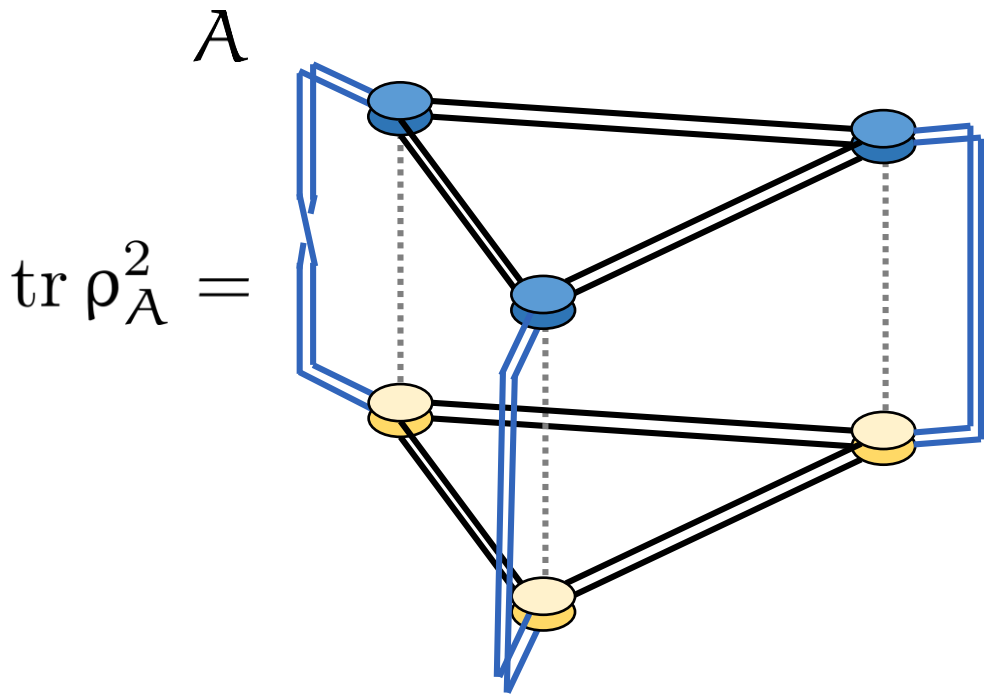
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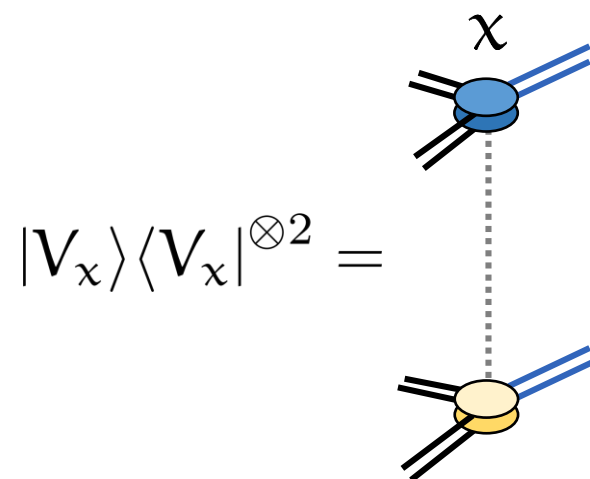
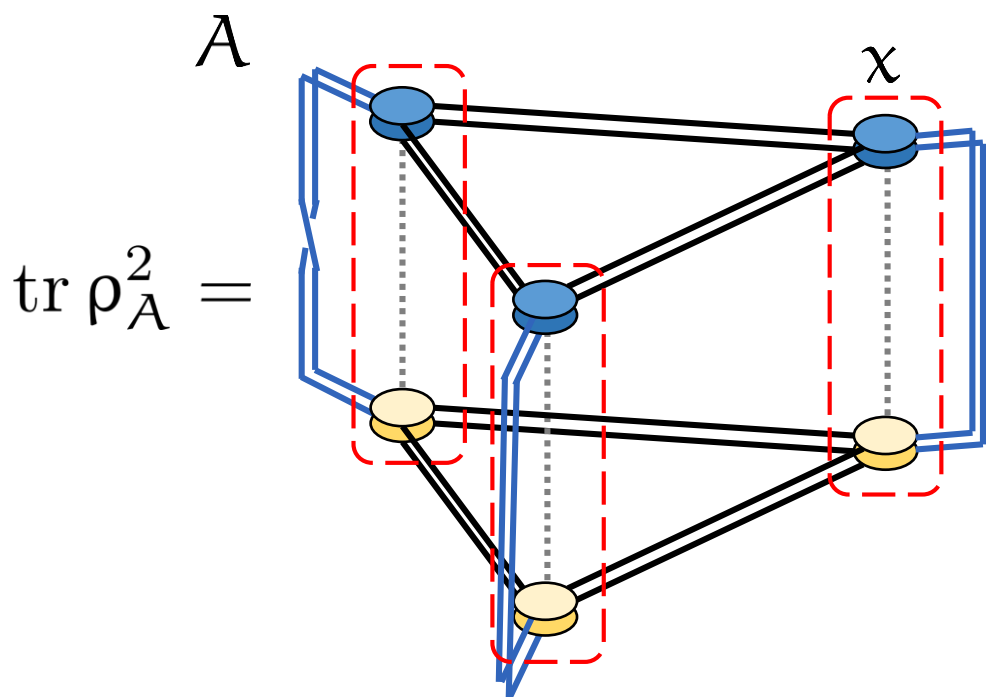


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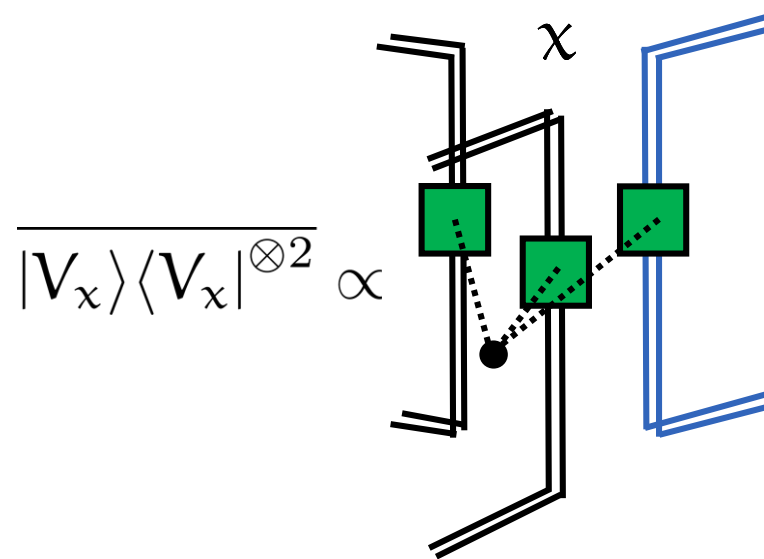
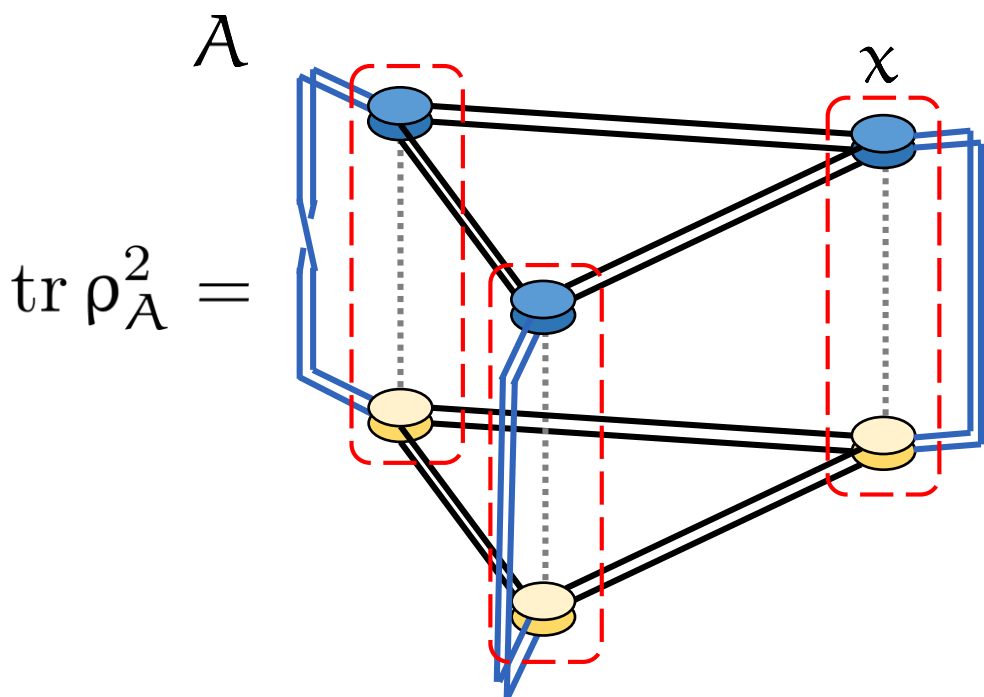


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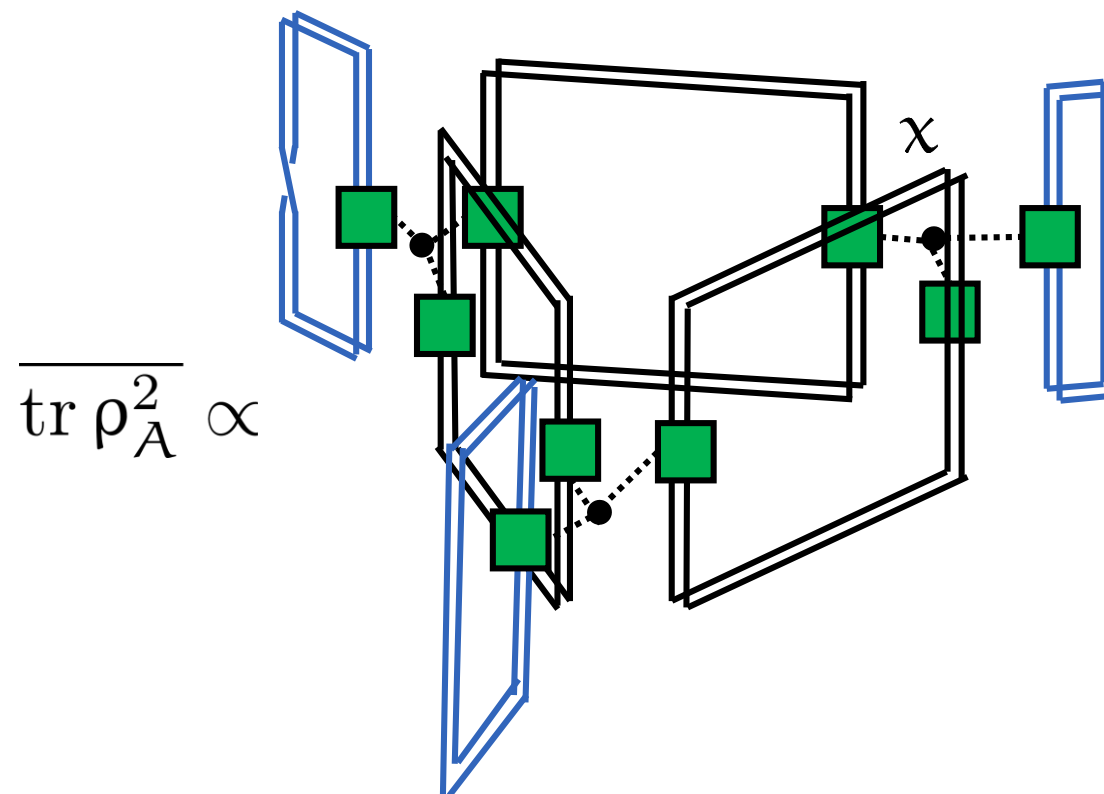
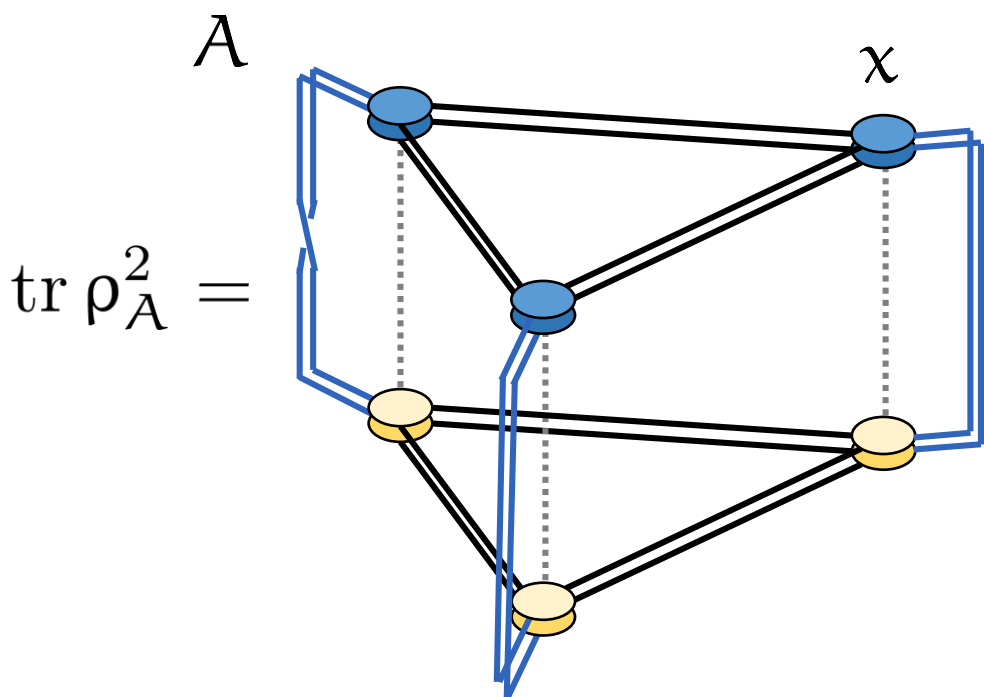
projector onto symmetric subspace

Calculation of Renyi entropy

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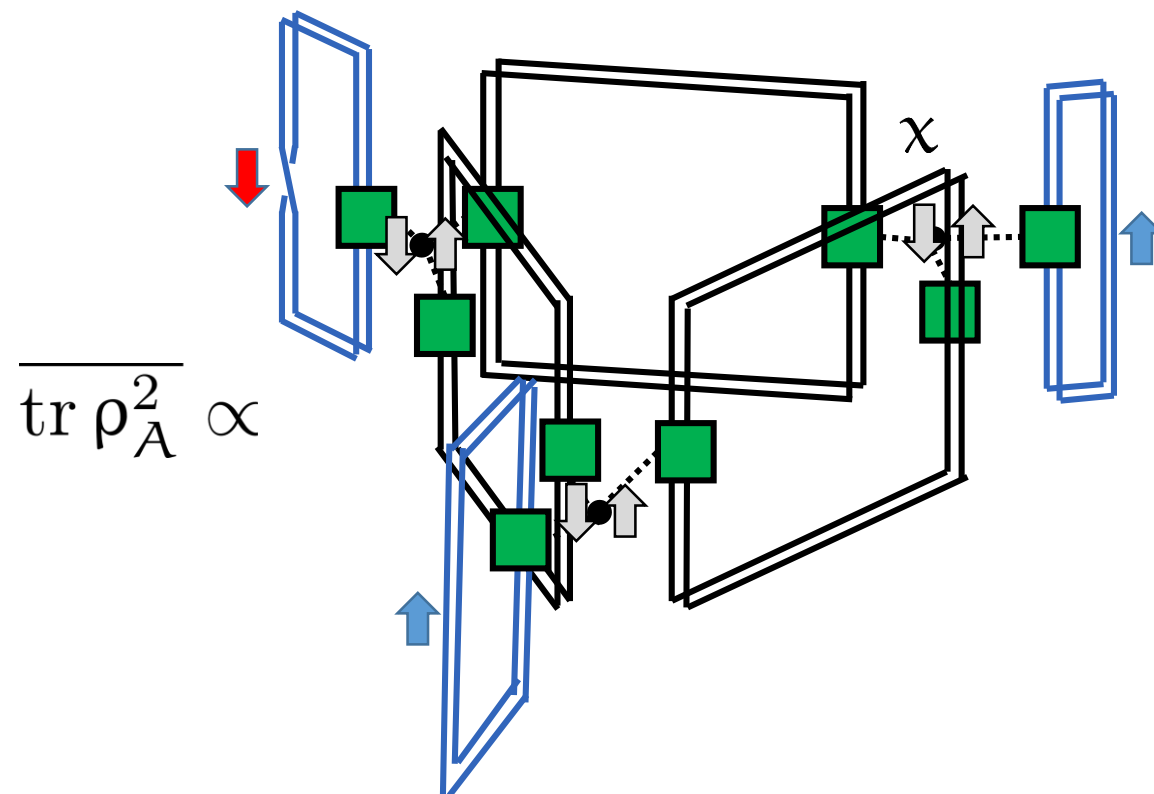
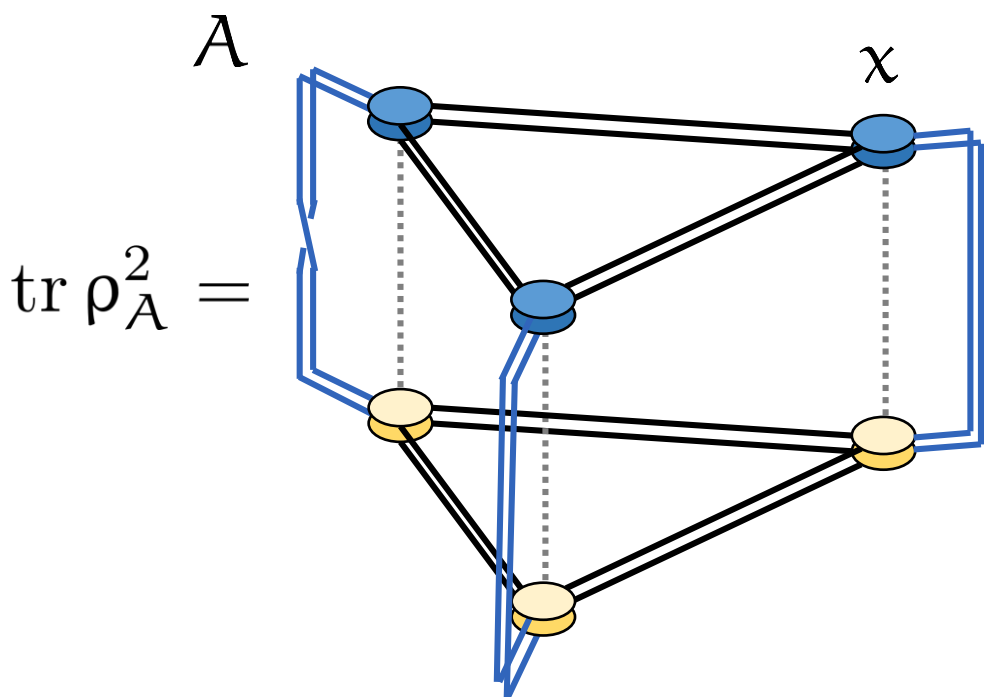
each loop is trace: factor D

Calculation of Renyi entropy

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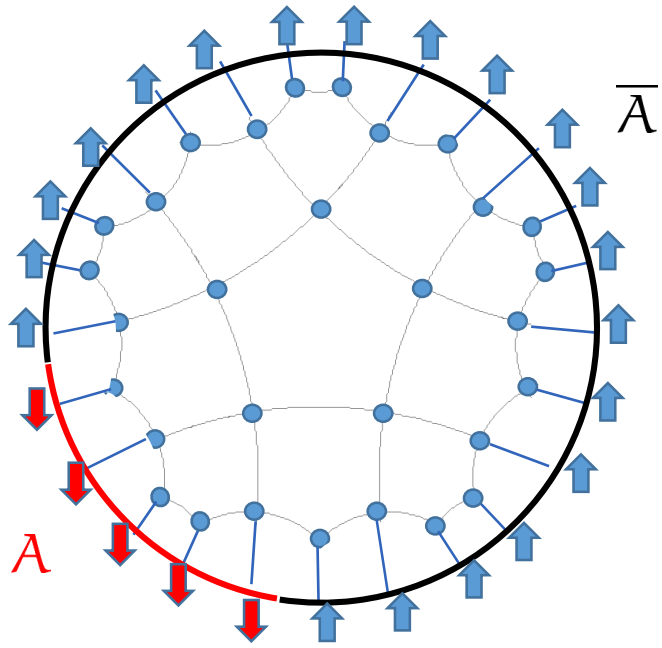
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Ising variables & boundary conditions!

Renyi entropy and Ising model

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



$$\overline{\text{tr} \rho_A^2} \simeq Z_A = \sum_{\{s_x\}} e^{-\left[\log D \right] \times \left[\frac{1}{2} \sum_{\langle x, y \rangle} (1 - s_x s_y) \right]}$$

1/T ferromagnetic Ising action

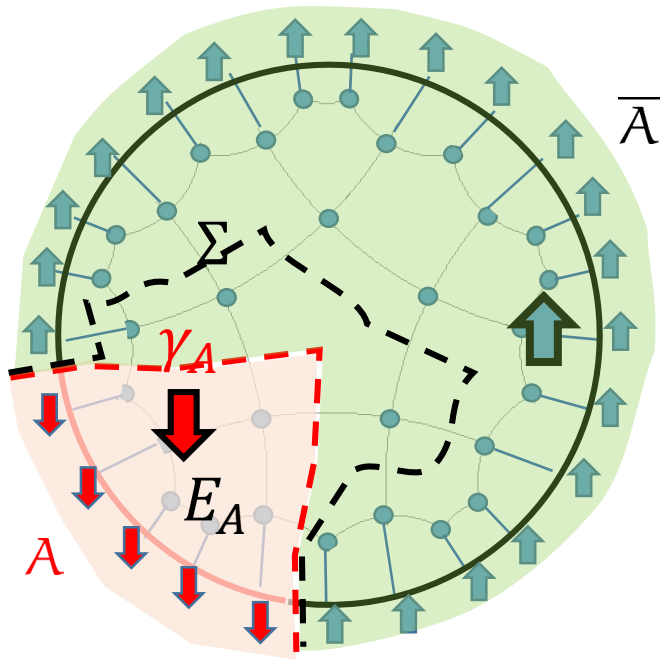
$$S_2(A) \simeq -\log Z_A$$

free energy

... + $O(1)$ if multiple minimal domain walls. NB: Can estimate D_{crit} from Ising physics [Onsager]!
Higher Renyi entropies and fluctuations controlled by higher S_n models.

Renyi entropy and Ising model

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



$1/T$ ferromagnetic Ising action

$$\overline{\text{tr} \rho_A^2} \simeq Z_A = \sum_{\{s_x\}} e^{-\boxed{\log D} \times \boxed{\frac{1}{2} \sum_{\langle x,y \rangle} (1 - s_x s_y)}}$$

$$S_2(A) \simeq -\log Z_A \simeq \log D |\gamma_A| \quad \text{large } D / \text{low } T$$

free energy dominated by minimal energy cfg.

The same is true for the entanglement entropy:

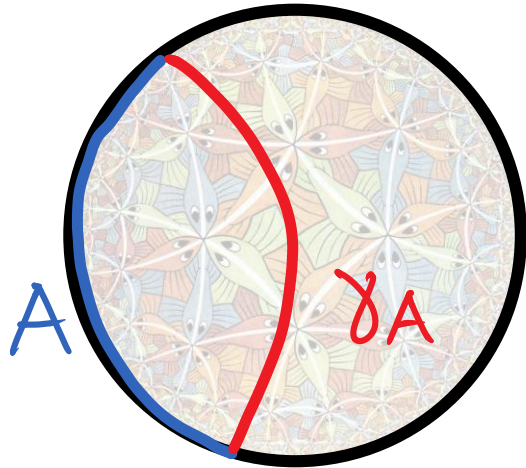
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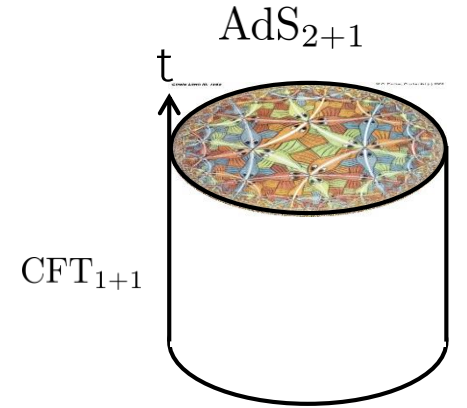
Entanglement entropy in AdS/CFT

[Ryu-Takayanagi]

This matches precisely the Ryu-Takayanagi proposal:



$$S(A) = \frac{1}{4G_N} \min |\gamma_A|$$



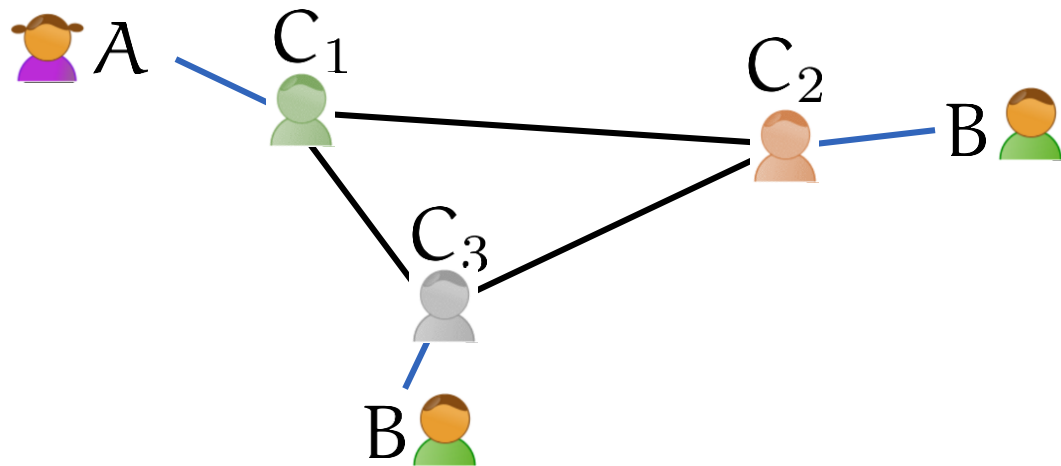
Possible interpretation: (1) Start with semiclassical *bulk quantum gravity* state for which Planckian degrees of freedom satisfy *area law*.

(2) Fix bulk Planckian degrees of freedom to *typical values*.

(3) This induces the Ryu-Takayanagi formula on the *dual boundary CFT*.

QIT interlude I: entanglement of assistance [Smolin-Verstraete-Winter] [Hayden-Dutil]

Multiparty entanglement distillation: induce entanglement between Alice and Bob with help of Charlies by measuring & classically communicating results



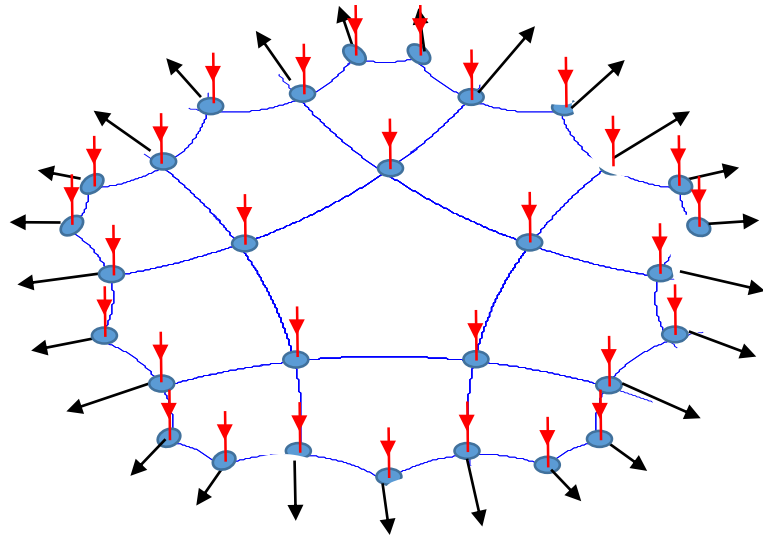
initial collection of Bell pairs

$$|\Psi\rangle = \underbrace{\left(\bigotimes_x \langle V_x | \right)}_{\text{measurement in random basis}} \overbrace{\left(\bigotimes_{\langle x,y \rangle'} |xy\rangle \right)}_{\text{optimal! merges state w.h.p.}}$$

measurement in random basis
optimal! merges state w.h.p.

$$\lim_{n \rightarrow \infty} \frac{1}{n} E_{\text{assist}}(A^n; B^n) = \min_{M \subset V \setminus AB} S(A \cup M) = S_{RT}(A)$$

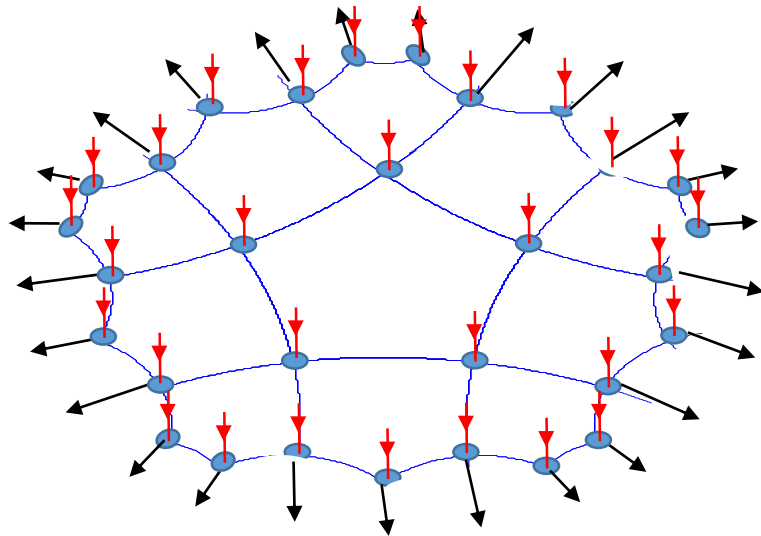
General mechanism for producing Ryu-Takayanagi from area law state!



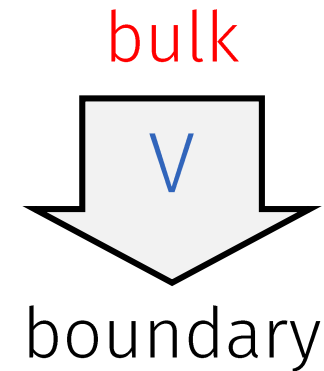
Random tensor networks as
holographic mappings

Bulk-boundary mapping from random tensor networks

Tensor network determines “holographic” mapping:



bond dimensions $D_b \ll D$



To study properties, highly useful to consider “fictitious” state $|\Psi_{\text{bulk, boundary}}\rangle$.

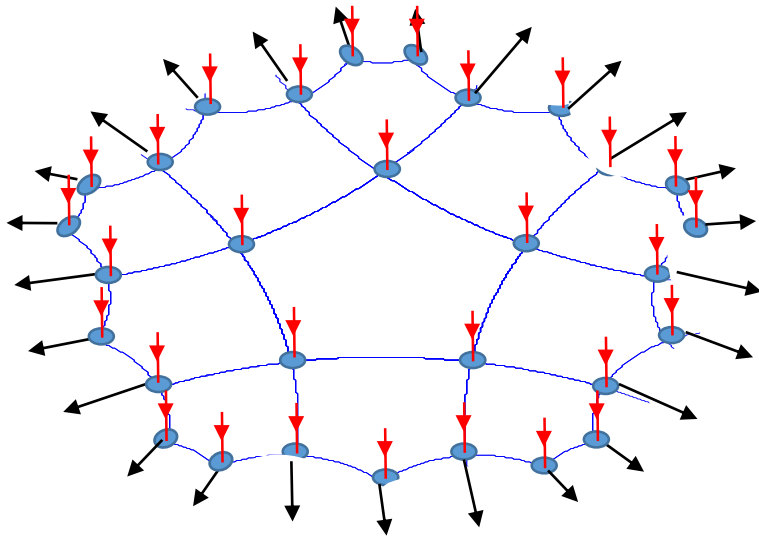
Properties of bulk-boundary mapping

Holographic mapping is **isometry** (preserves probabilities) if

$$S(\text{bulk}) = N \log D_b$$

That is, if minimal domain wall cuts off **bulk legs**.

Consequence of Ising calculation!



bond dimensions $D_b \ll D$

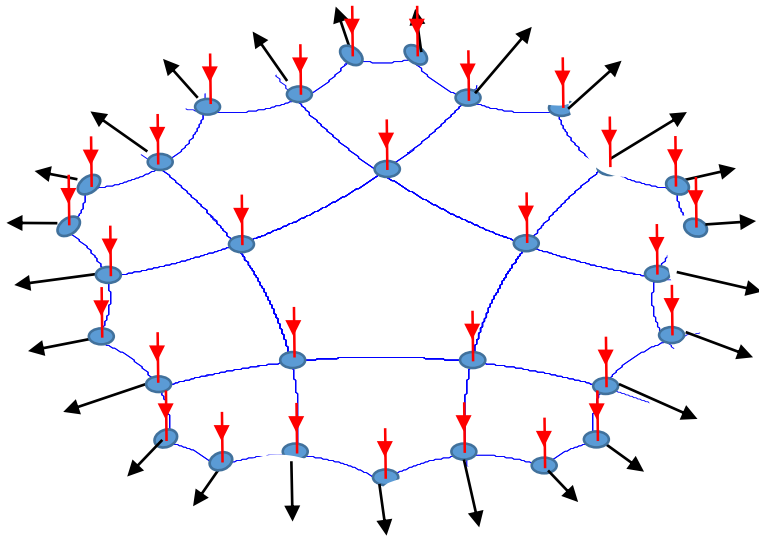
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Consequence of Ising calculation!



bond dimensions $D_b \ll D$

Thus: can faithfully map **states and operators**:

$$|\psi_\partial\rangle = V |\psi_b\rangle$$

$$O_\partial = V \phi_b V^\dagger$$

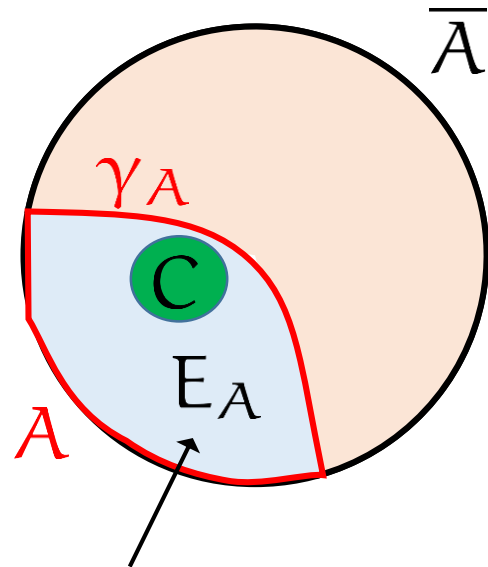
All correlation functions are preserved.

Locality of bulk-boundary mapping

$$O_{\partial} = V\phi_b V^{\dagger}$$

Given a local bulk operator ϕ_C . How local we can we choose boundary operator O_A ?

Answer:



“Entanglement wedge”

Reduces to an entropy calculation!

$$I(E_A : \overline{A} \overline{E_A}) = 0$$

Here, $I(X:Y) = S(X) + S(Y) - S(XY)$ is the quantum mutual information. Can perfectly recover from A if completely decoupled from environment – “no cloning”.

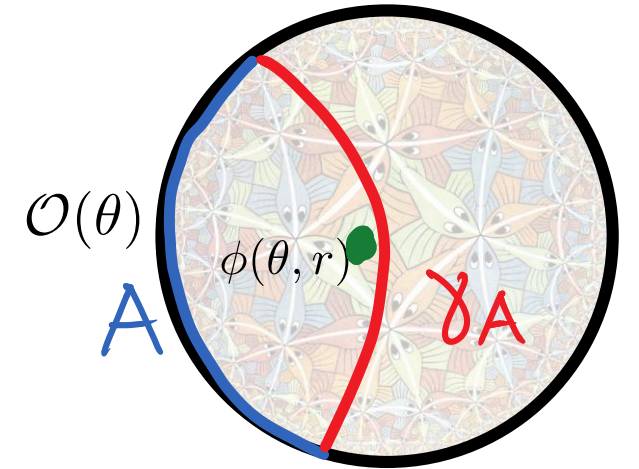
Bulk and boundary observables in AdS/CFT

Bulk in terms of boundary: “smearing”

$$\phi(\theta, r) = \int K(\theta, r; \tilde{\theta}, \tilde{t}) \mathcal{O}(\tilde{\theta}, \tilde{t}) d\tilde{\theta} d\tilde{t}$$

recovers in the “causal wedge”. [Hamilton-Kabat-L-L]

Our result matches the larger, long conjectured “entanglement wedge” reconstruction! [Dong-Harlow-Wall]

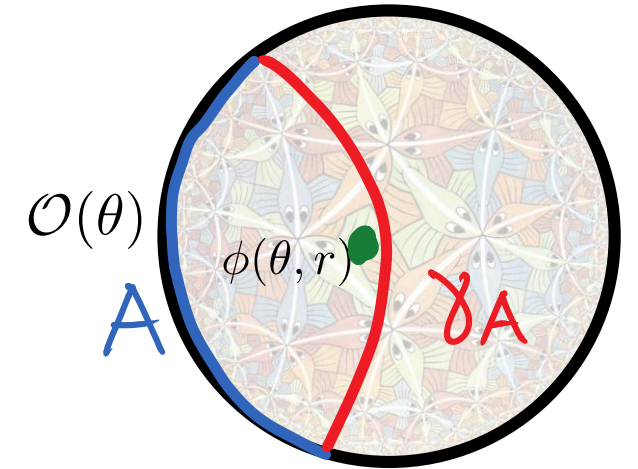


Bulk and boundary observables in AdS/CFT

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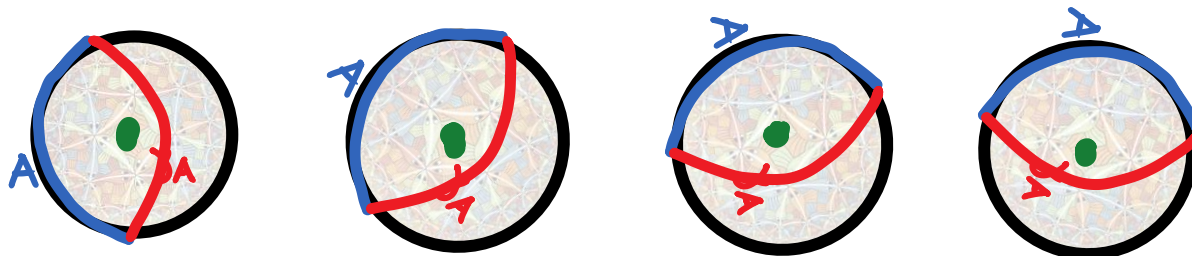
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For each bulk operator **many possible boundary operators**. Puzzle? [Almheiri et al]

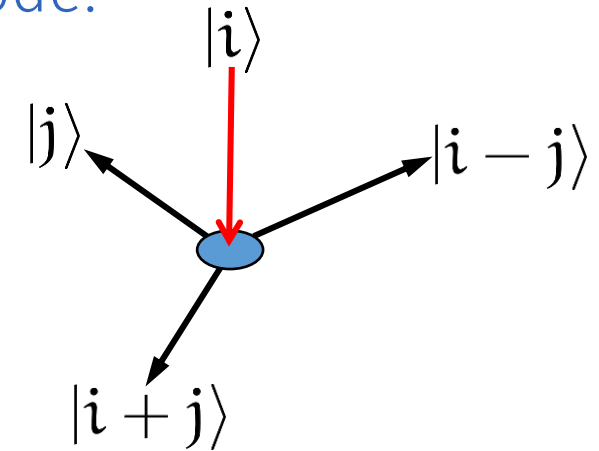


This redundancy is the feature of a [quantum error correcting code](#)!

Example: [Three-qutrit erasure code](#)

$$V\phi = O_{12}V = O_{23}V = O_{13}V$$

can correct for loss of any single qutrit



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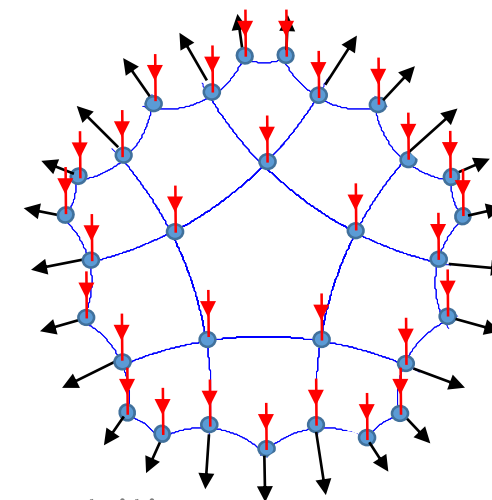
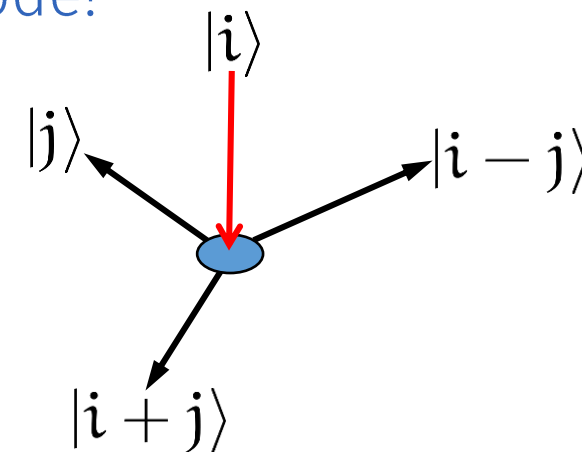
can correct for loss of any single qutrit

→ Tensor network toy models from “perfect tensors”

[Pastawski, Yoshida et al]

Holographic codes are erasure codes with remarkable locality:

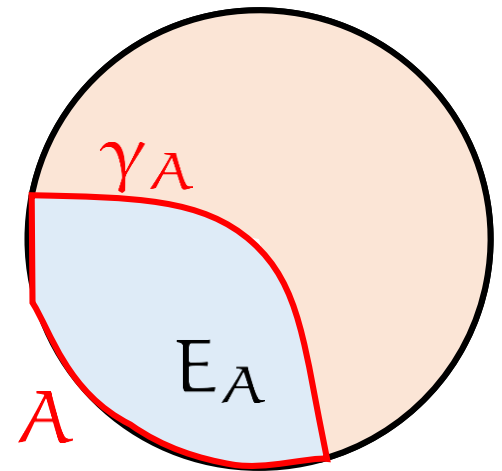
Quantum information deeper in the bulk is better protected.



What are the **typical properties of boundary states** (code states)?

Ising action acquires additional “bulk term”. Result:

$$S(A) \simeq \min \{ \log D |\gamma_A| + S(E_A)_{\rho_b} \}$$



Result matches precisely the corrections to the Ryu-Takayanagi formula in AdS/CFT due to **entanglement in bulk quantum fields**. [Faulkner et al]

Bulk corrections

$$|\psi_a\rangle = V |\psi_b\rangle$$

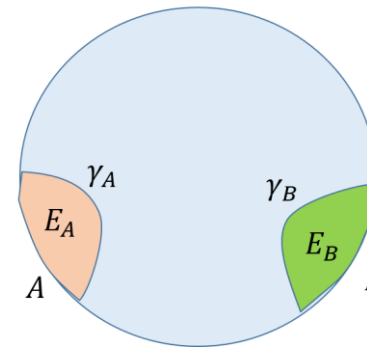
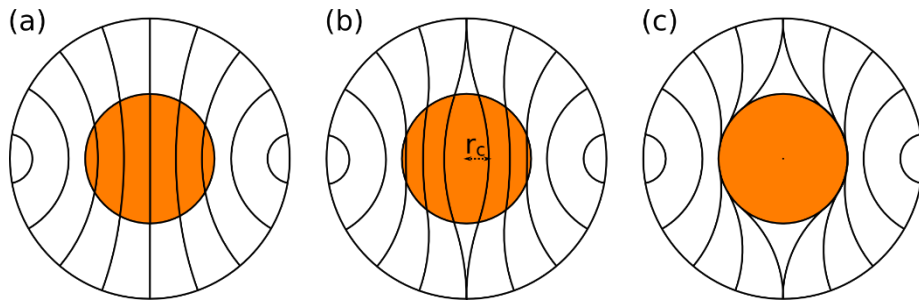
$$S(A) \simeq \boxed{\text{min}} \{ \log D |\gamma_A| + \boxed{S(E_A)_{\rho_b}} \}$$

minimal geodesics get deformed (unless $D_b \ll D$)

contribution from bulk entanglement

horizons from adding massive amounts of bulk entropy (analog of BH formation)

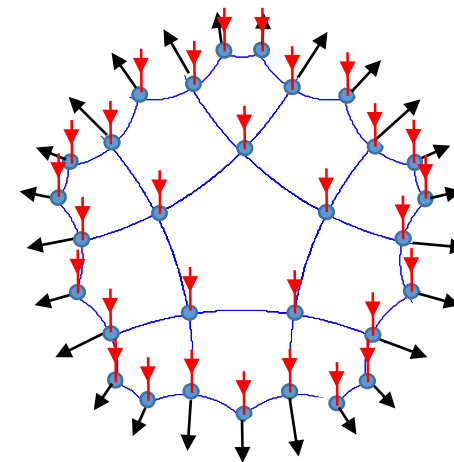
correlations in bulk state get encoded into boundary state



$$I(A : B) = I(E_A : E_B)_b$$

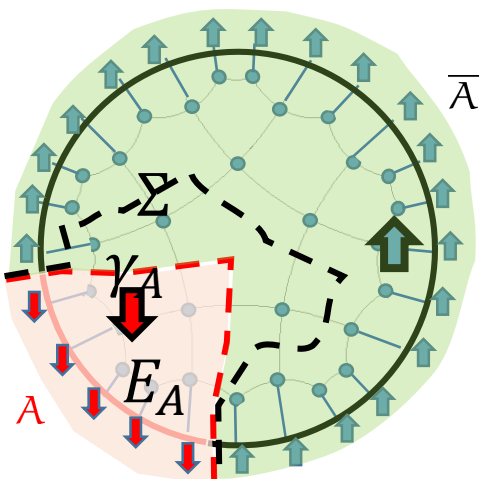
Random tensor networks reproduce several basic structural features of AdS/CFT correspondence:

- entropic structure, boundary reconstruction, bulk corrections
- analog of black hole formation, correlation spectrum, ...
- *not* restricted to AdS



...toy models, emphatically *not* CFT states!

Program: elucidate **general mechanism** by which holographic properties can arise (typicality)



Thank you for your attention