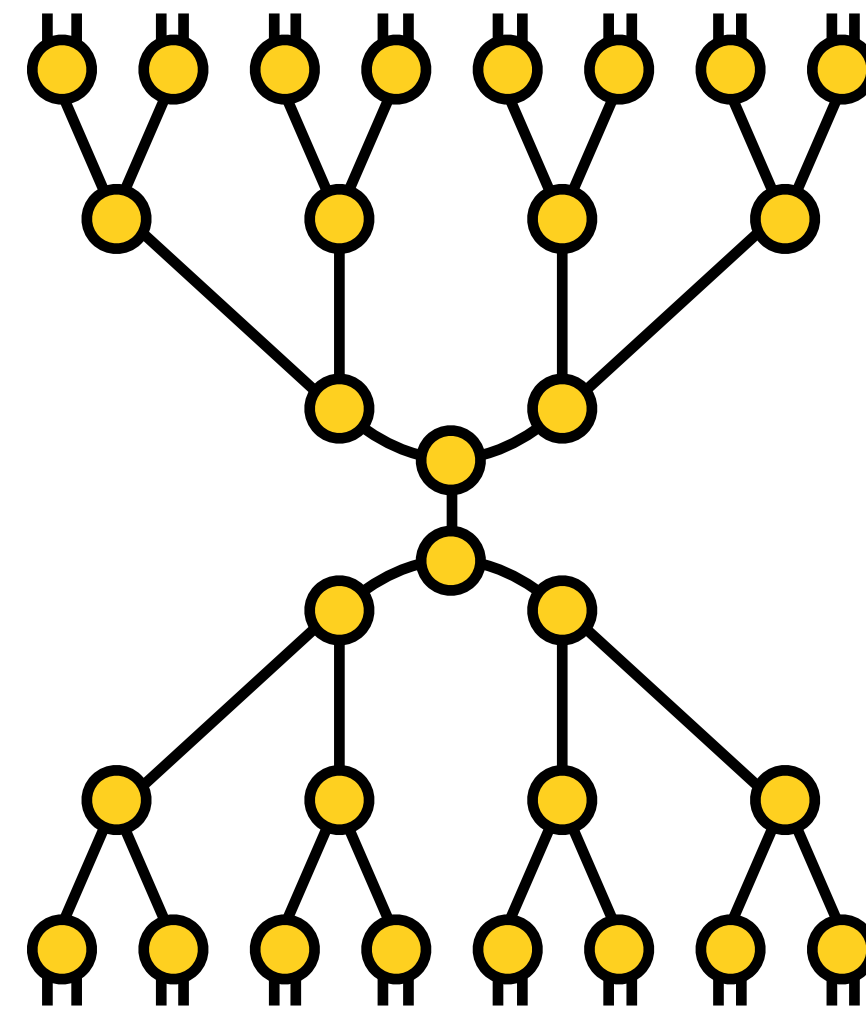


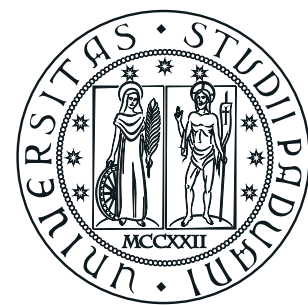
# Entanglement in finite-temperature Rydberg arrays

with tensor networks



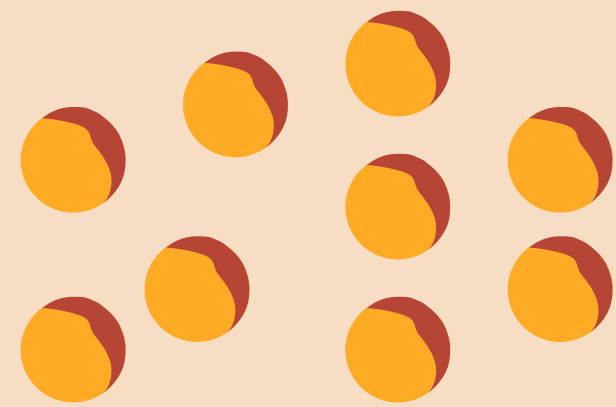
Nora Reinić @ Quantum Computing @ INFN

University of Padova



# Simulating quantum many-body systems

## The quantum many-body problem

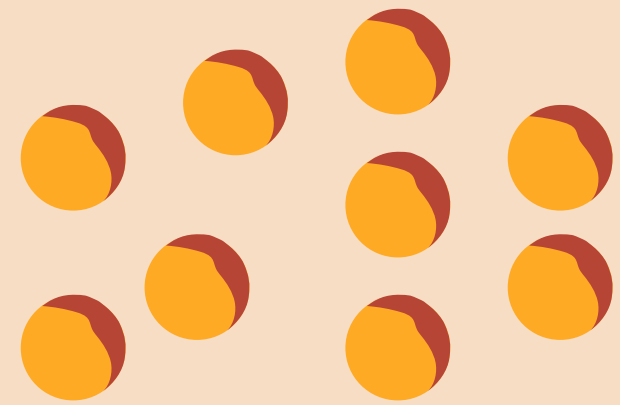


### System:

- $N$  particles on a lattice
- Local Hilbert space dimension  $d$

# Simulating quantum many-body systems

## The quantum many-body problem



### System:

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**Dimension of the total Hilbert space is  $d^N$**

Too big to be simulated exactly for large number of particles!

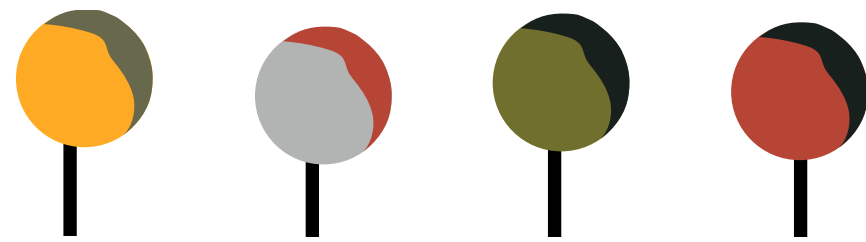
# Tensor network methods

**Number of degrees of freedom of quantum many-body state depends on the amount of entanglement in the system**

# Tensor network methods

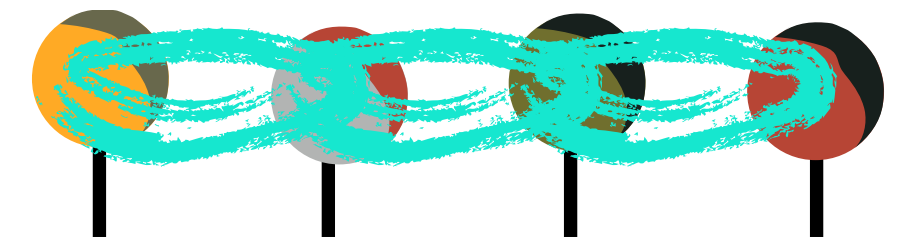
Number of degrees of freedom of quantum many-body state depends on the amount of entanglement in the system

No entanglement



Easy to simulate

A lot of entanglement

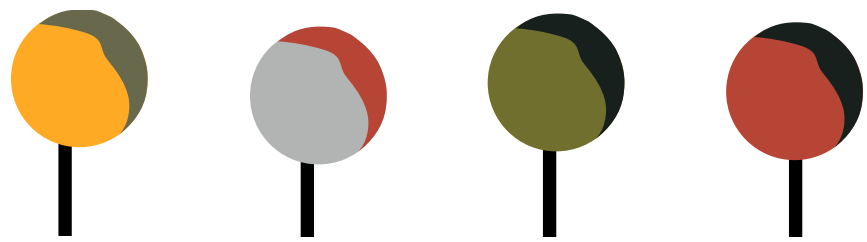


Exponential number of degrees of freedom

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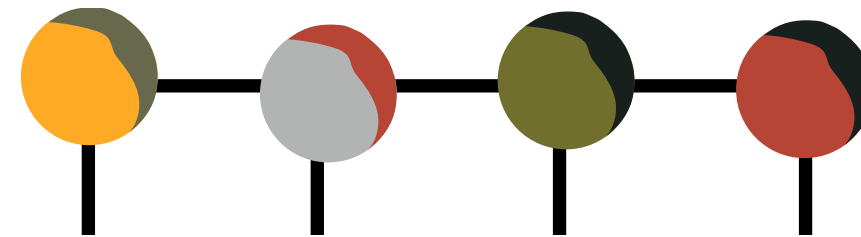
Mean field approximation

**This scenario is usually not the case**

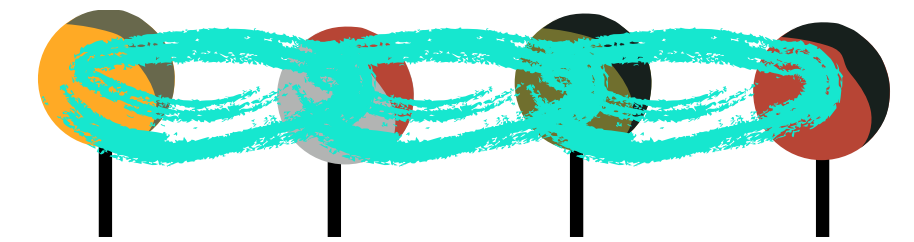
**Many realistic physical systems:**

**the amount of entanglement is sufficiently low**

(area law of entanglement)



A lot of entanglement



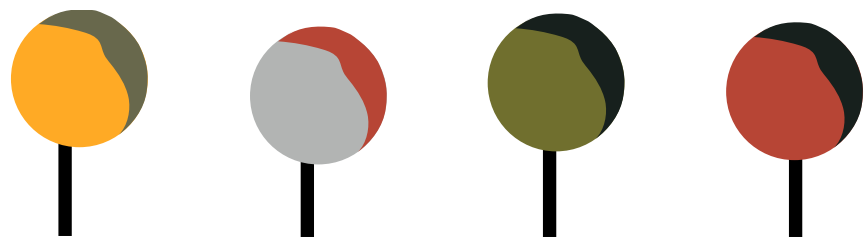
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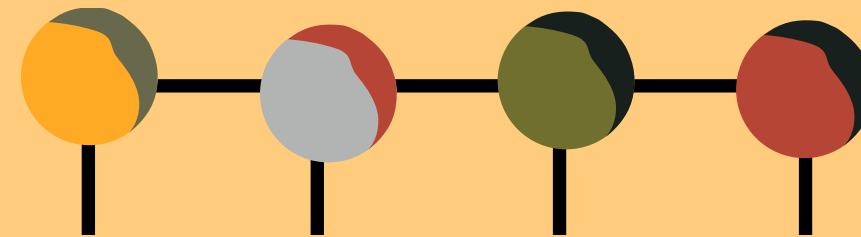
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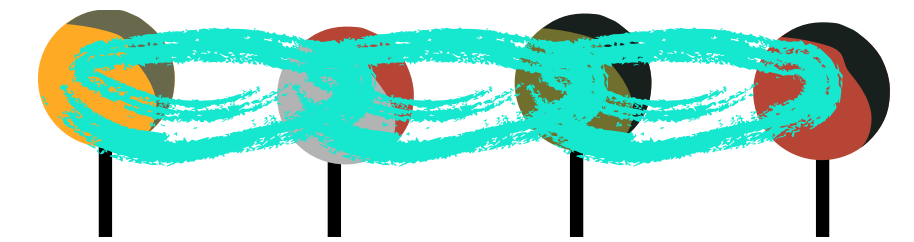
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## TENSOR NETWORK METHODS



**Keep only certain amount of entanglement in the system and discard the rest**

A lot of entanglement



Exponential number of degrees of freedom

**This scenario is usually not the case**

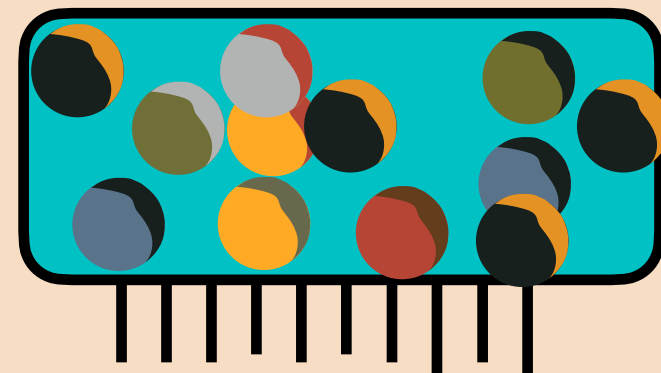
# Tensor network ansatz idea

One vector of exponentially scaling dimension

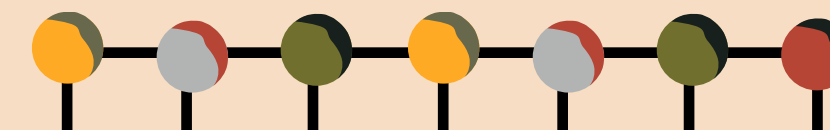


Ansatz: multiple interconnected tensors of “small” dimensions

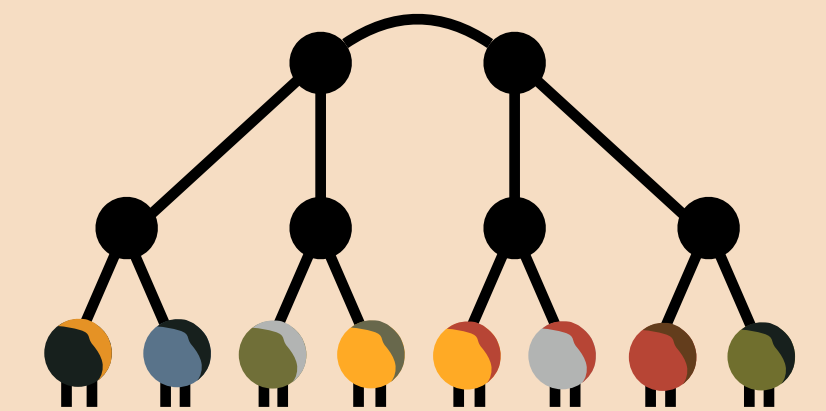
$$|\psi\rangle =$$



$$d^N$$



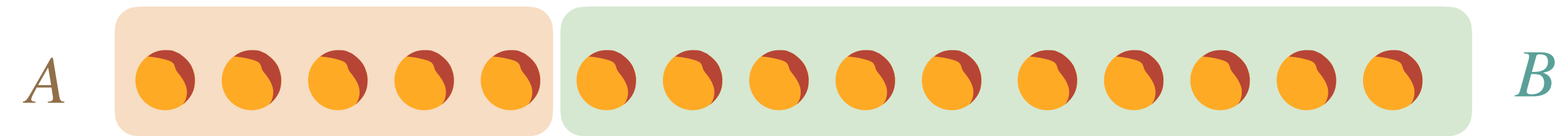
Matrix Product State



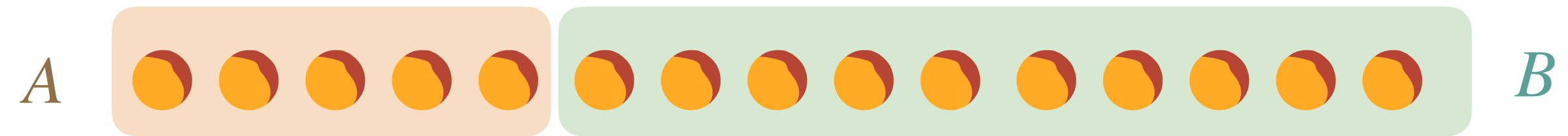
Tree Tensor Network



# Bipartite entanglement measures



# Bipartite entanglement measures



## Pure states

Statevector description

$$|\psi\rangle$$

## Mixed states

Density matrix description

$$\rho = \sum_j p_j |\psi_j\rangle \langle \psi_j|$$

# Bipartite entanglement measures



## Pure states

Statevector description

$$|\psi\rangle$$

Well-defined via reduced density matrix entropies

## Entanglement entropy

$$\mathcal{S} = \text{Tr}(\rho_A \ln \rho_A) = \sum_i \lambda_i \ln \lambda_i$$

**Straightforward to measure!**

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No unique way to measure mixed-state entanglement!

Entanglement negativity:  $E_N = \frac{\|\hat{\rho}^{\top_{N/2}}\|_1 - 1}{2}$

Entanglement of formation:  $E_F = \inf_{\{|\psi_j\rangle, p_j\}} \left\{ \sum_j p_j \mathcal{S}_E(|\psi_j\rangle) : \hat{\rho} = \sum_j p_j |\psi_j\rangle \langle \psi_j| \right\}$

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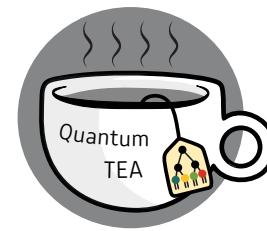
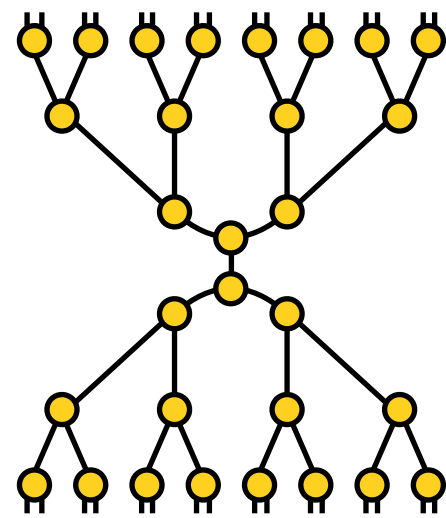
How to efficiently measure mixed-state entanglement of a quantum many-body system?

# Simulating systems at finite temperature

Talk plan:

## Part 1.

Tensor network toolbox for  
finite-temperature systems

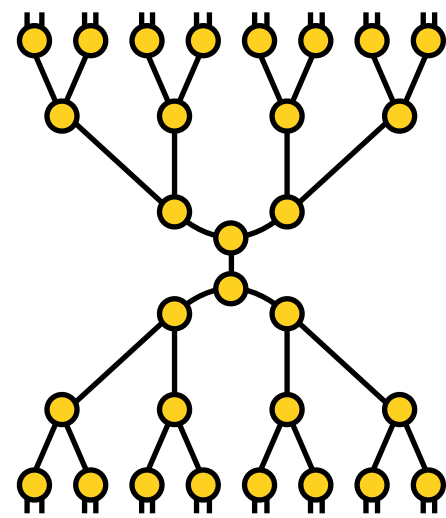


# Simulating systems at finite temperature

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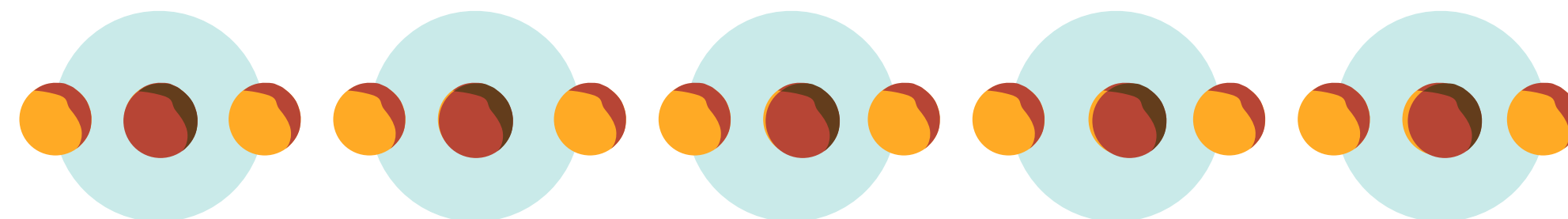
## Part 1.

Tensor network toolbox for  
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## Part 2.

Finite-temperature Rydberg array analysis

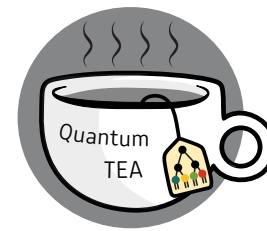
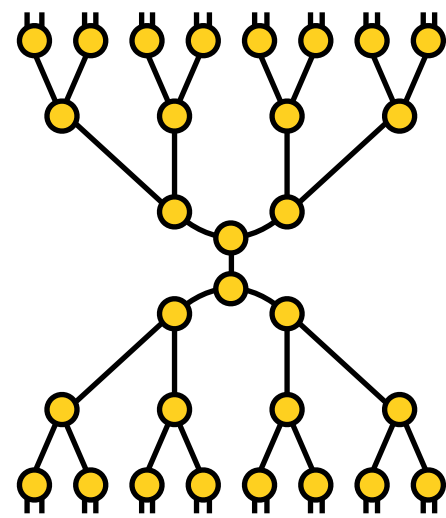


# Simulating systems at finite temperature

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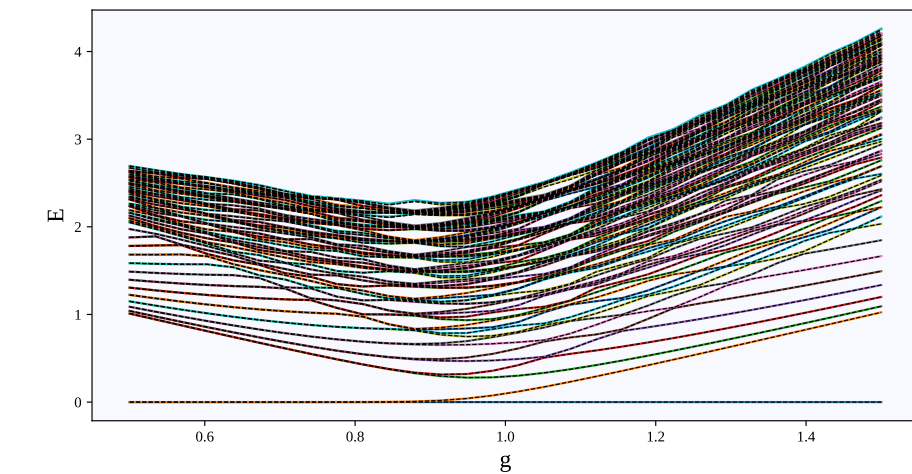
Tensor network toolbox for finite-temperature systems



## Part 3.

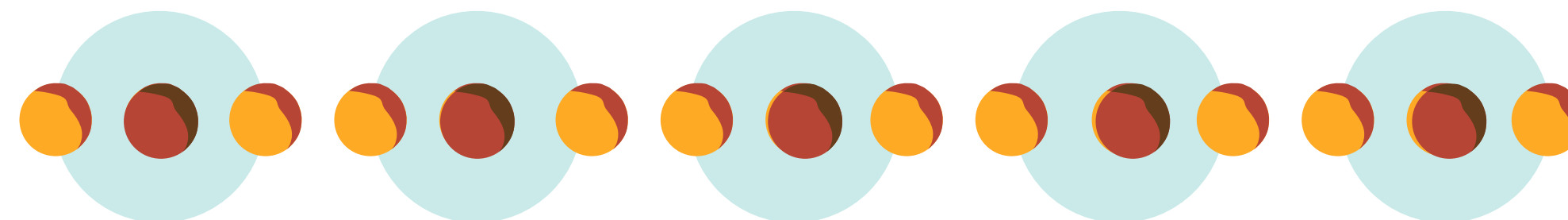
New project!

Extracting the **energy spectrum** of a quantum many-body system



## Part 2.

Finite-temperature Rydberg array analysis





# Part 1: **The algorithm**

# Part 1: Finite-temperature density matrix

**Setup:**

**Quantum many-body system**

**+**

**Thermal equilibrium**

# Part 1: Finite-temperature density matrix

Setup:

Quantum many-body system

+

Thermal equilibrium

How do we know in which state will the physical system be?

**Statistical physics: we can assign a **classical probability** to finding a system in each of the Hamiltonian eigenstates**

# Part 1: Finite-temperature density matrix

Setup: Quantum many-body system + Thermal equilibrium

How do we know in which state will the physical system be?

Statistical physics: we can assign a **classical probability** to finding a system in each of the Hamiltonian eigenstates

System is described with a **density matrix**

$$\rho = \sum_{j=1}^{d^N} p_j |\psi_j\rangle \langle \psi_j|$$

$$p_j = \frac{e^{-\beta E_j}}{Z}$$

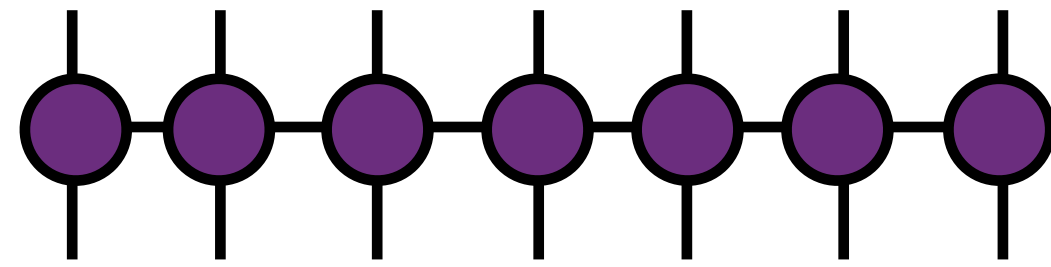
$|\psi_i\rangle$  = eigenstates of Hamiltonian

$E_i$  = eigenenergies of Hamiltonian

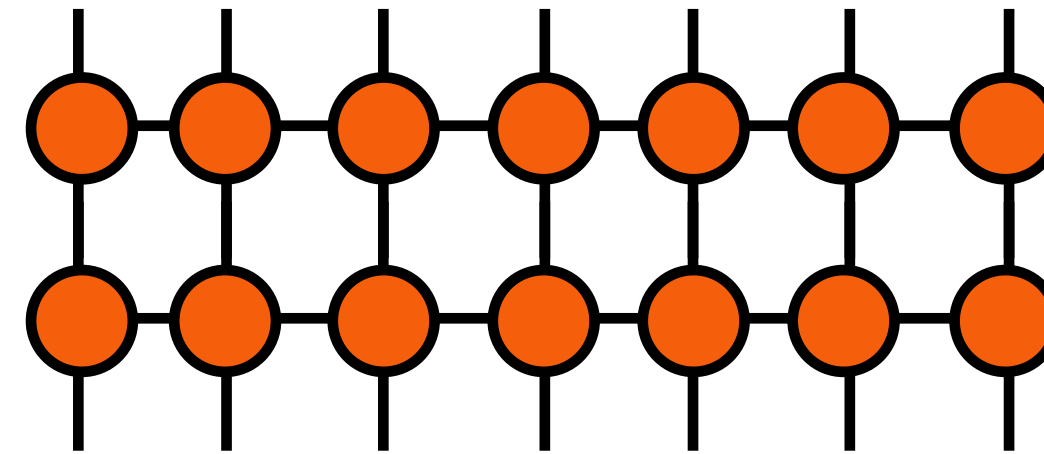
$$\beta = \frac{1}{k_B T} \quad Z = \sum_{i=1}^{d^N} e^{-\beta E_i}$$

# Common density matrix ansatzes

Matrix product operator  
(MPO)



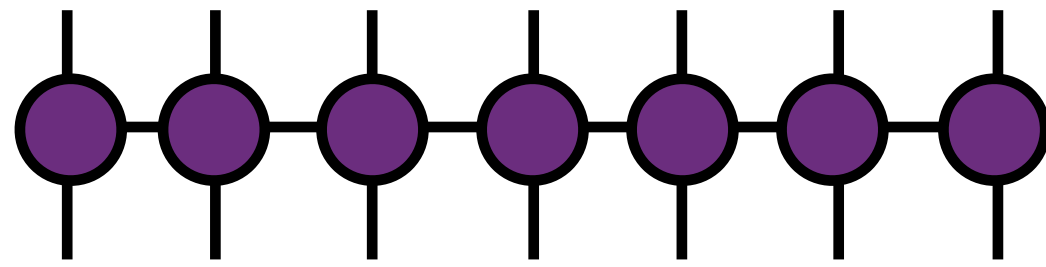
Locally purified tensor network  
(LPTN)



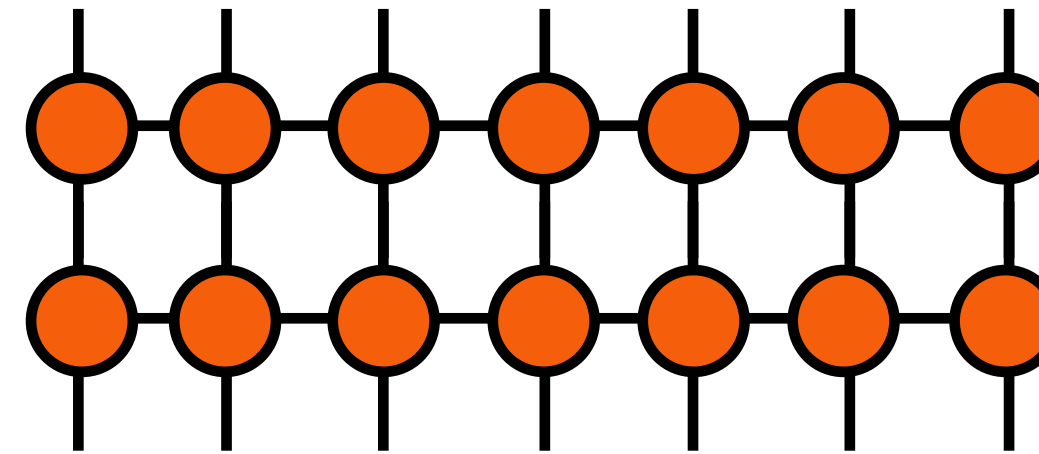
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Preserves **positivity**



No restriction  
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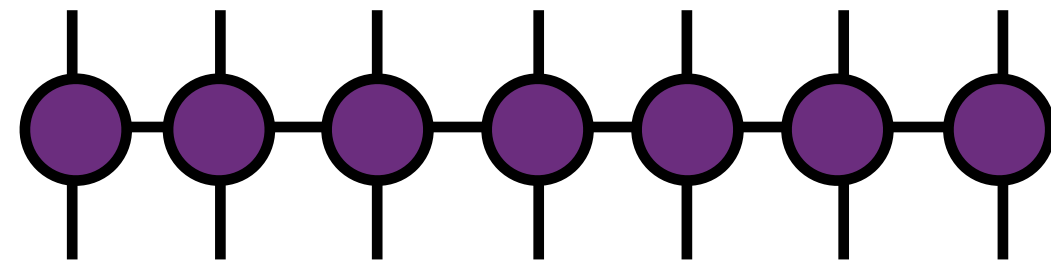


Access to **local**  
**observables**

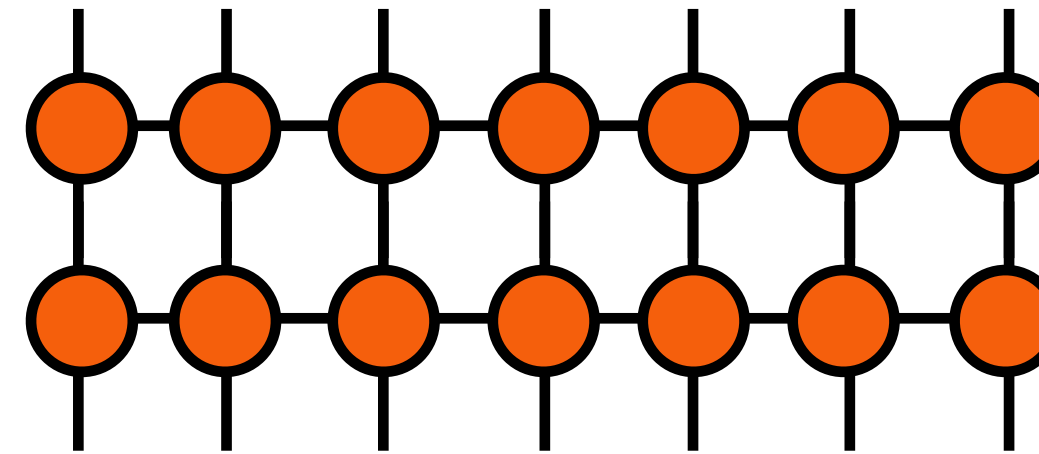


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Access to **local  
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Access to  
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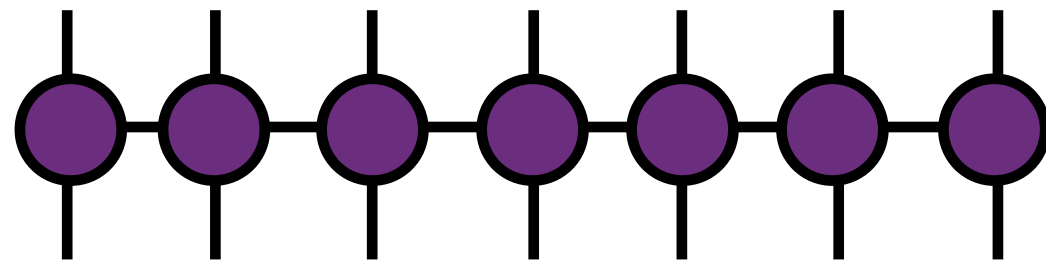
Access to **eigenvalues**  
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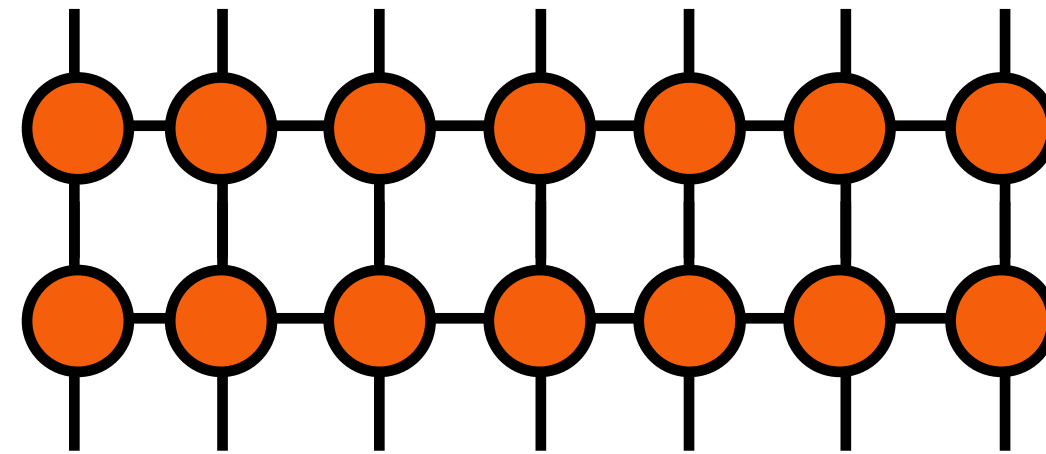
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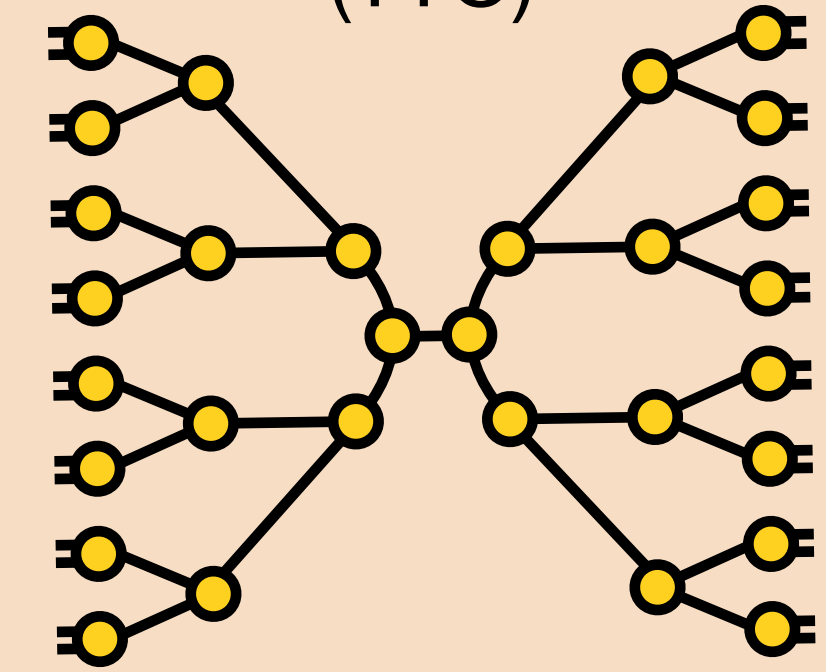


Locally purified tensor network (LPTN)



## Our proposal:

Tree tensor operator (TTO)



See: L. Arceci, P. Silvi, and S. Montangero  
Phys. Rev. Lett. 128, 040501 (2022)

Preserves **positivity**



No restriction on **mixedness**



Access to **local observables**



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# Tree tensor operator

L. Arceci, P. Silvi, and S. Montangero  
Phys. Rev. Lett. 128, 040501 (2022)

$$\rho = XX^\dagger$$

Columns of  $X$  are given

with

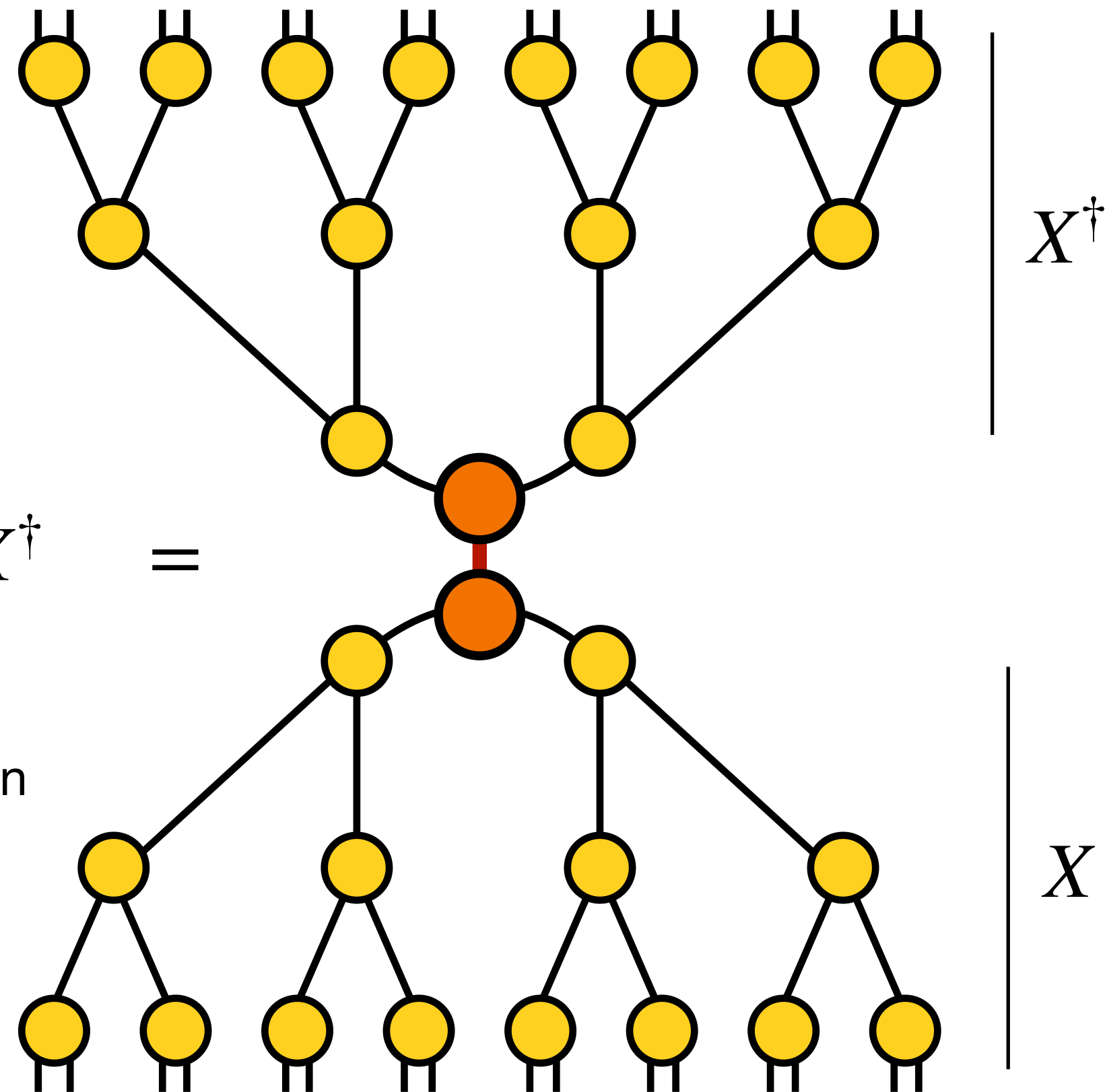
$$\sqrt{p_j} |\psi_j\rangle$$

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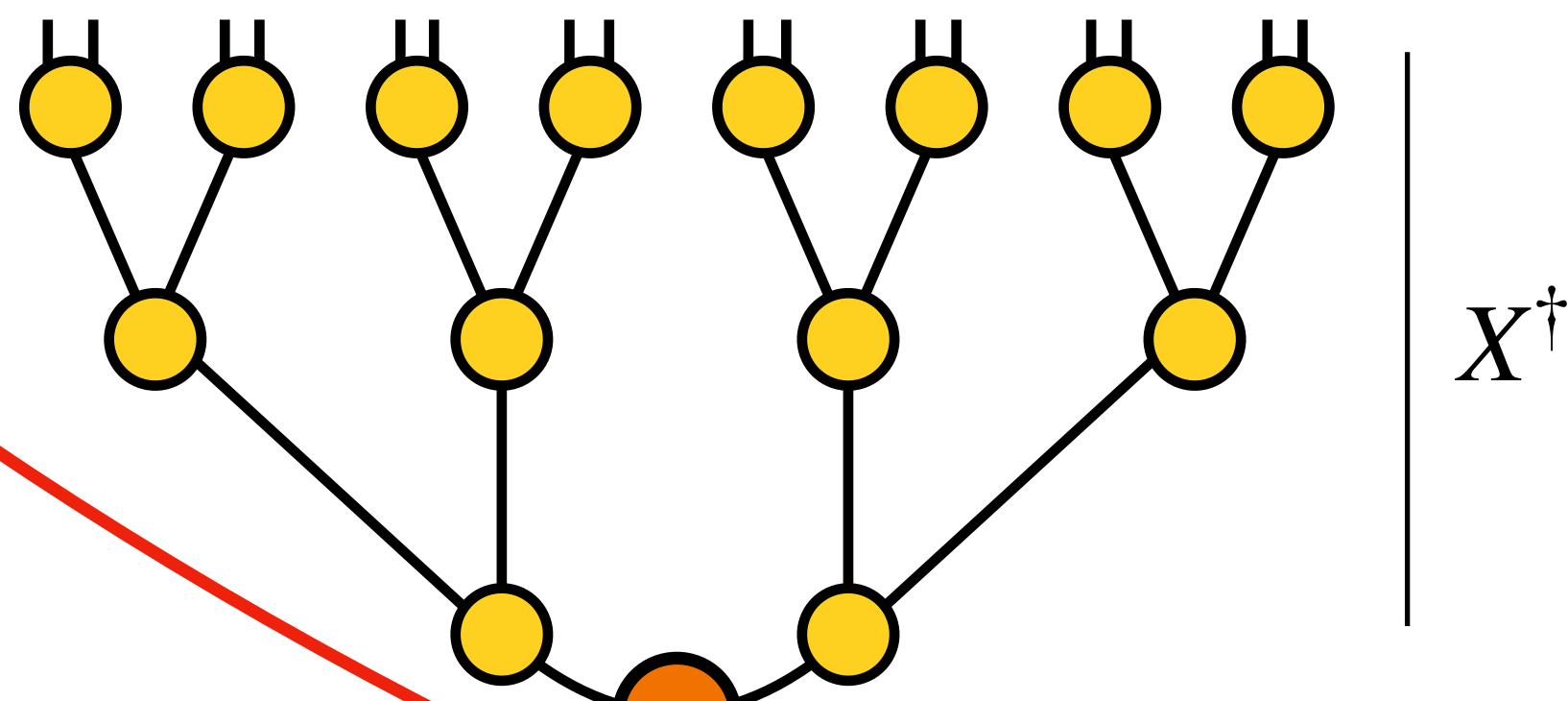
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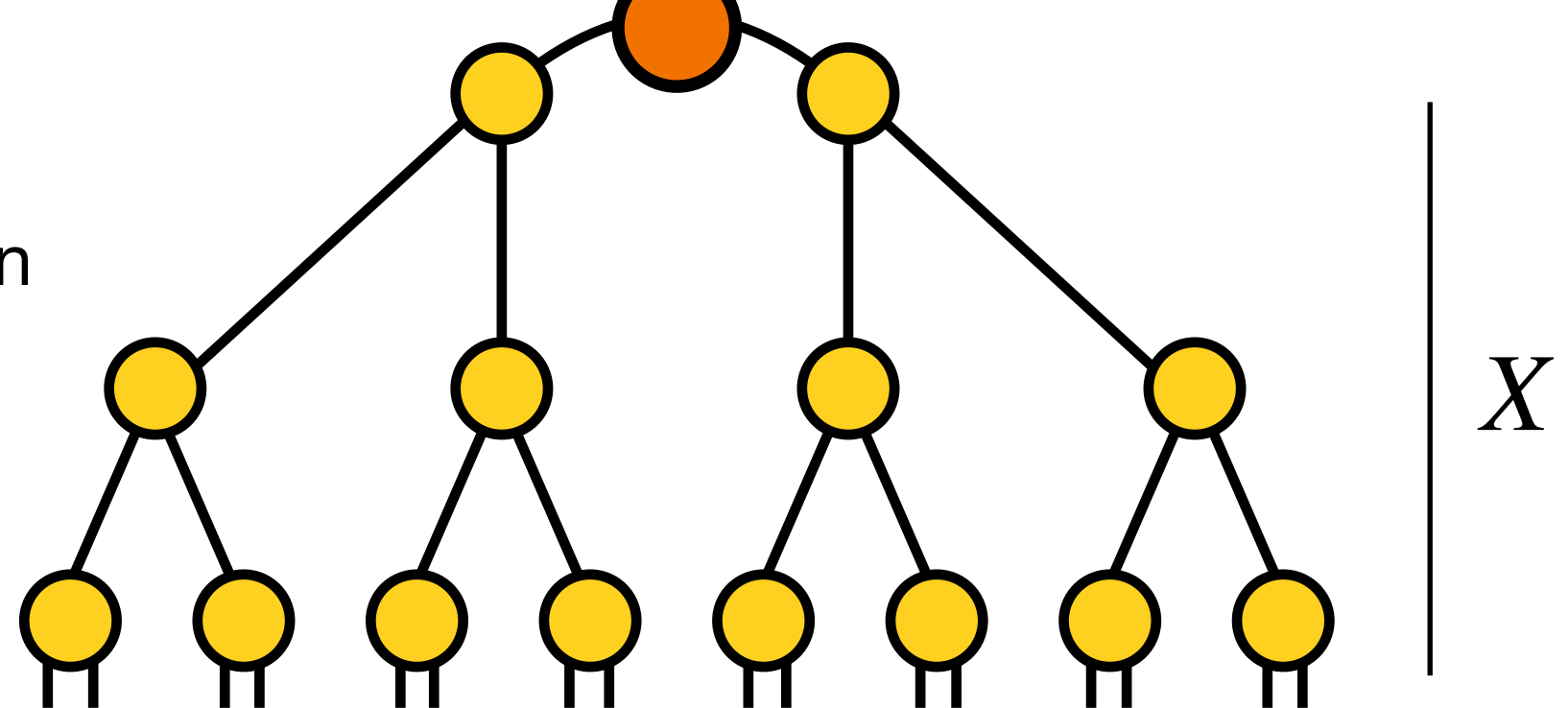
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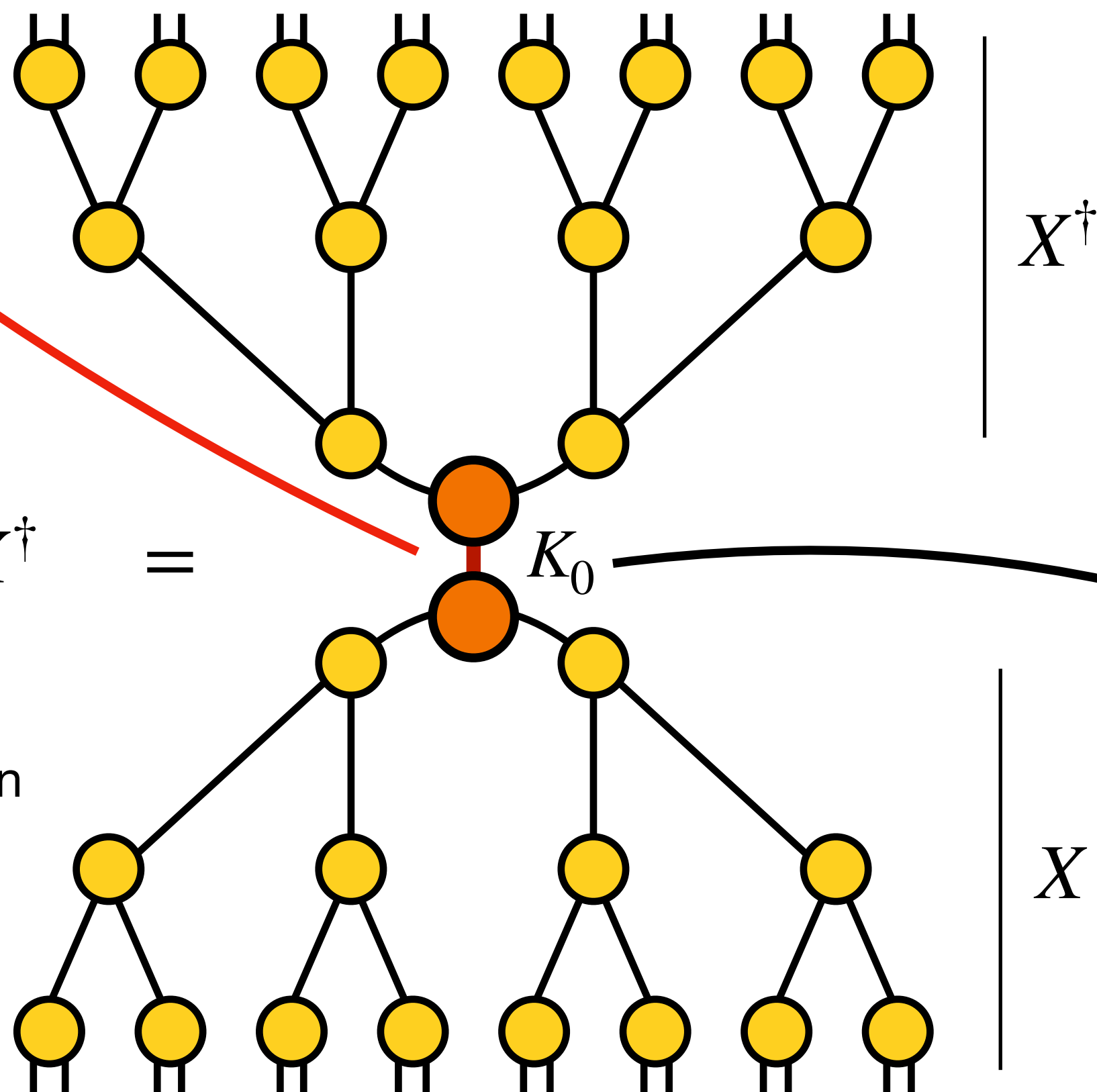
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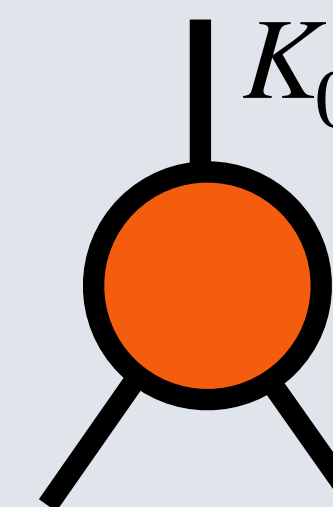


$$\rho = XX^\dagger =$$

Columns of  $X$  are given with  $\sqrt{p_j} |\psi_j\rangle$

Root tensor = compressed density matrix

All information about **bipartite entanglement** is compressed into a single tensor



Singular values of this tensor are  $\sqrt{p_j}$

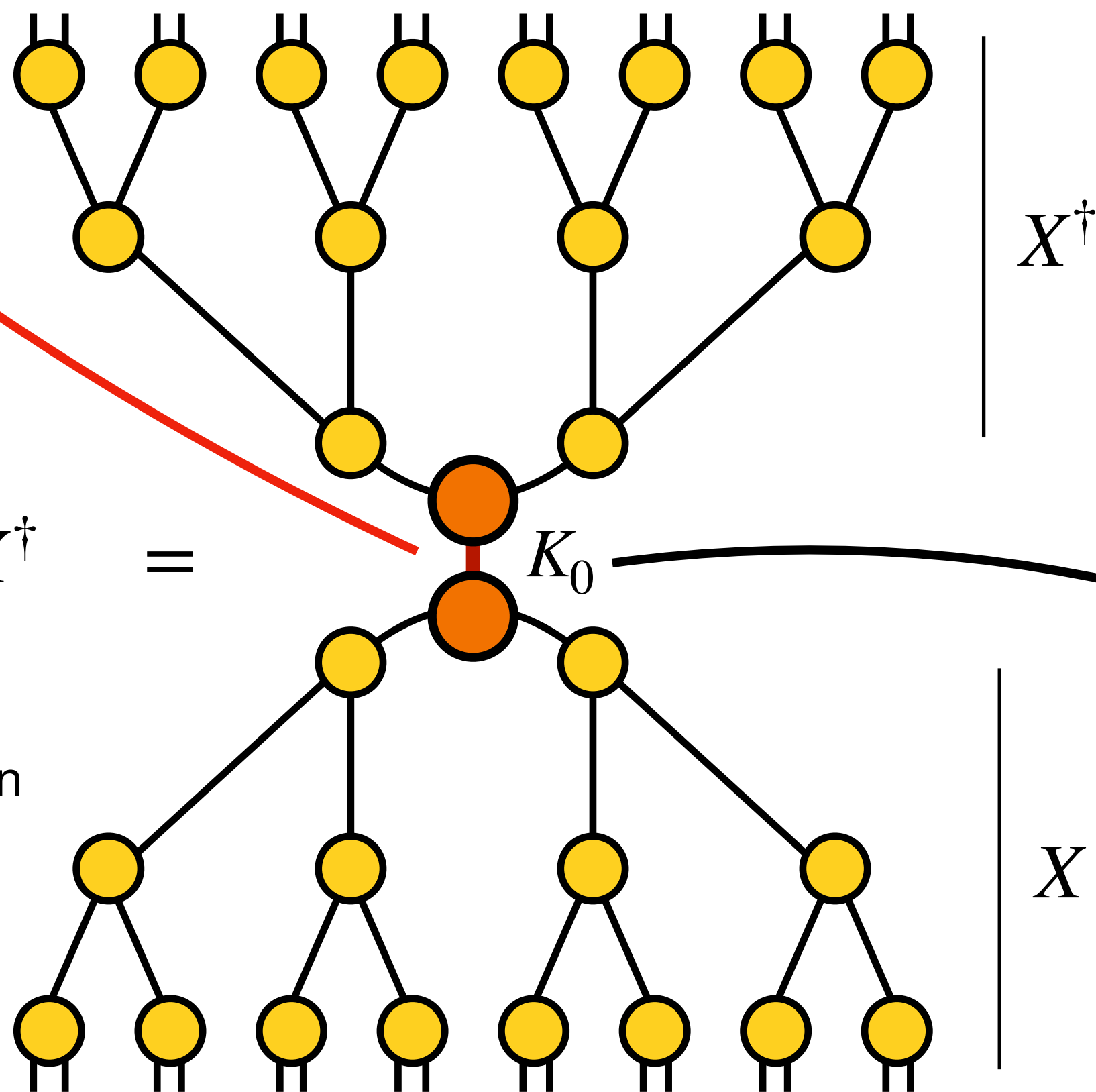
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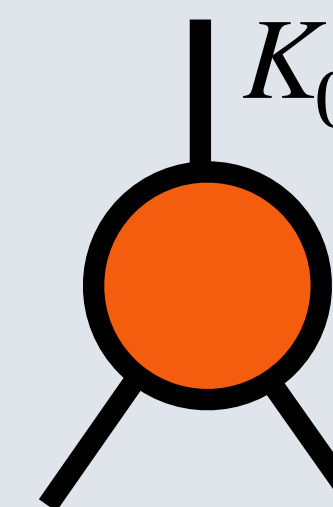
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**Question: how to efficiently compute the thermal density matrix in a TTO ansatz?**

# How to obtain a TTD thermal density matrix?

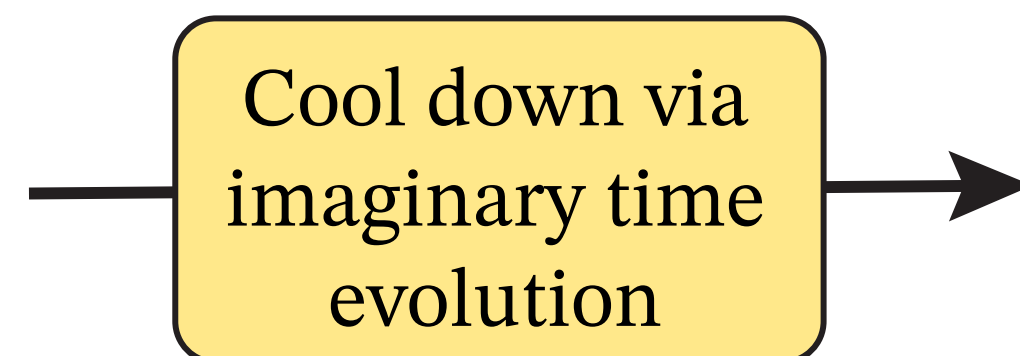
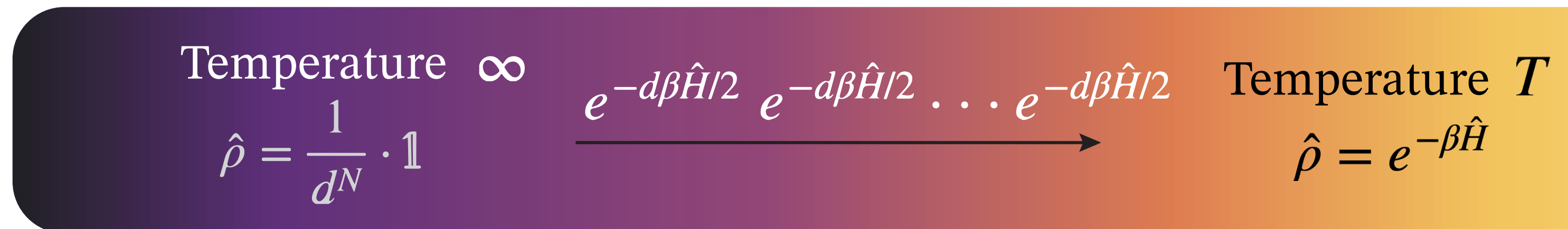
**2-step process:**

N. Reinić, D. Jaschke, D. Wanisch, P. Silvi, S. Montangero  
Phys. Rev. Research 6, 033322 (2024)

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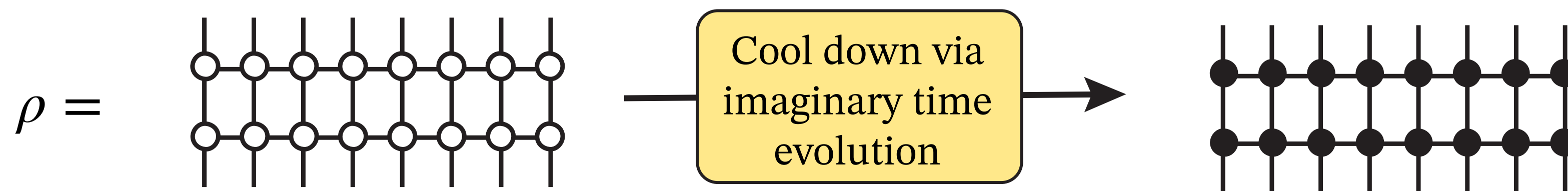
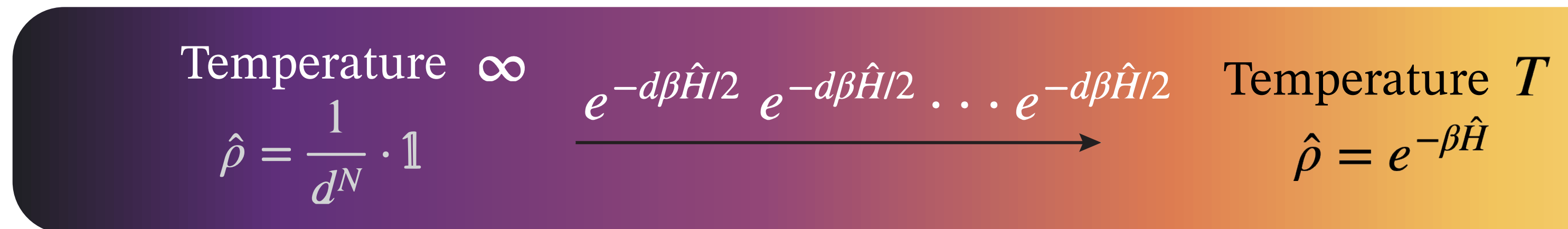
Mathematically equivalent to **time evolution**  
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$$\frac{it}{\hbar} \rightarrow \frac{\beta}{2} = \frac{1}{2T}$$

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N. Reinić, D. Jaschke, D. Wanisch, P. Silvi, S. Montangero  
 Phys. Rev. Research 6, 033322 (2024)

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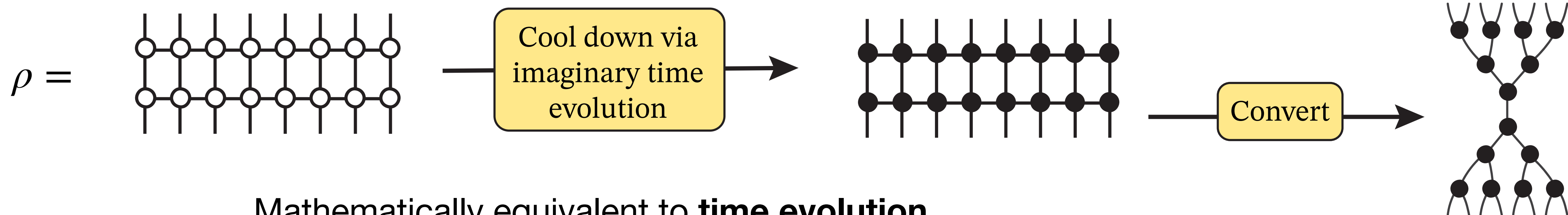
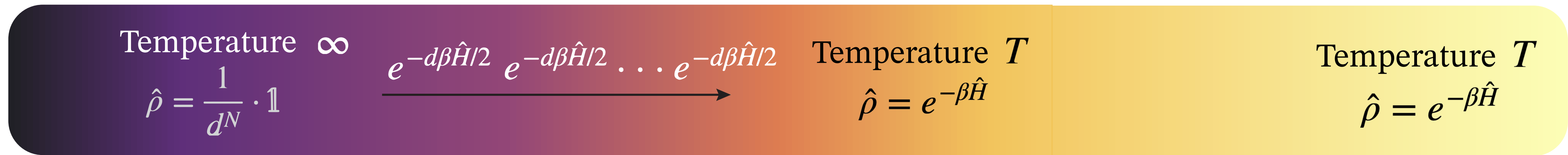
Locally Purified Tensor Network



# How to obtain a TTO thermal density matrix?

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**2-step process:**



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Conversion using an iterative  
 procedure of tensor decompositions  
 and manipulations

Locally Purified Tensor Network

Tree Tensor Operator

## **Part 2: Application to finite temperature Rydberg arrays**

# Part 2: Finite-temperature Rydberg arrays

$$n_z = \frac{1}{2}(\sigma_z + 1)$$

$\Omega$  - Rabi frequency

$\Delta$  - Detuning

$$\hat{H} = \underbrace{\frac{\Omega}{2} \sum_i^N \sigma_x^i - \Delta \sum_i^N n_z^i}_{\text{Laser terms}} + \underbrace{\sum_{i \neq j} \frac{C_6}{R_{ij}^6} n_z^i n_z^j}_{\text{Rydberg blockade mechanism}}$$

1D chain with open boundaries

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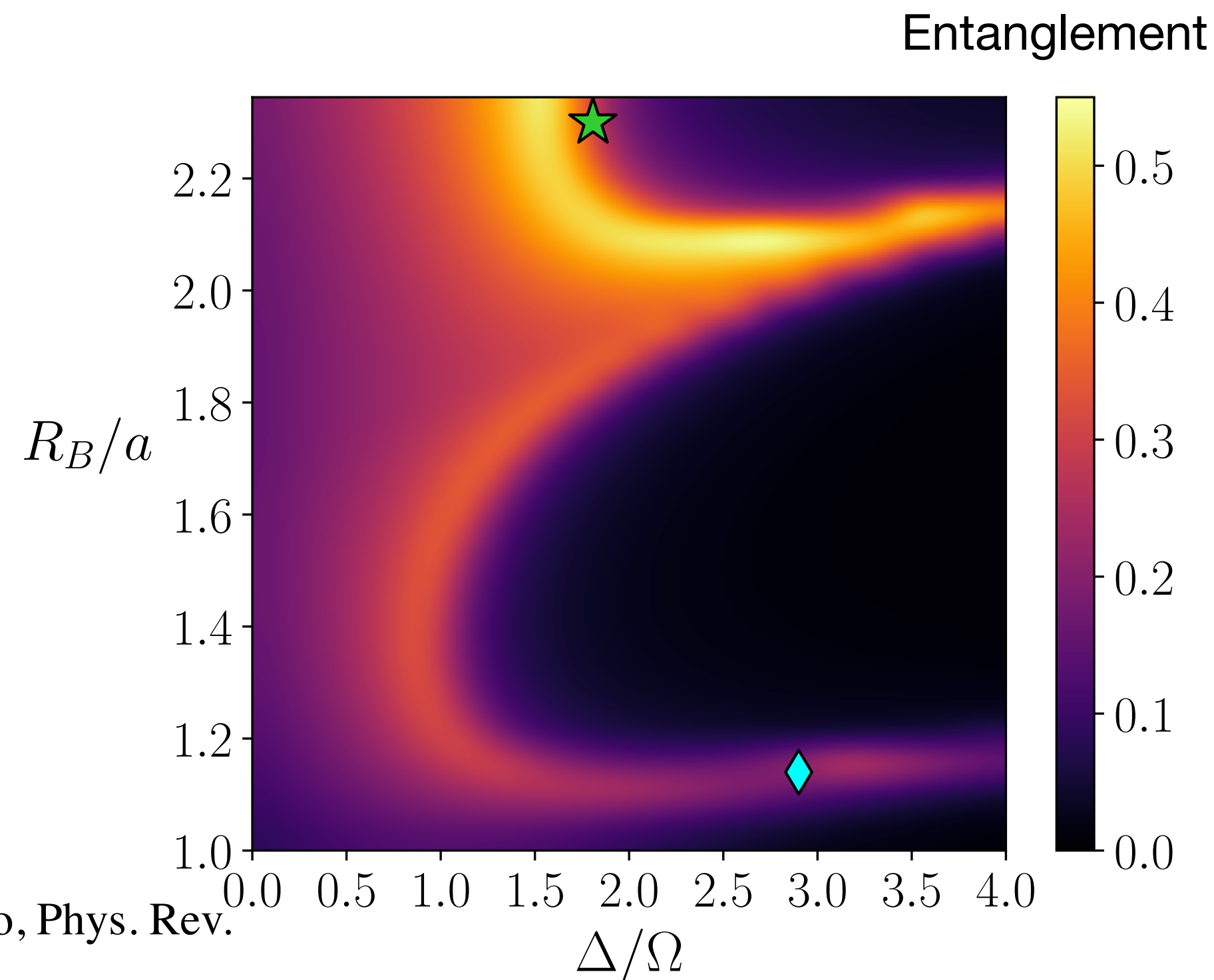
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Blockade radius:

$$R_B = \sqrt[6]{\frac{C_6}{\Omega}}$$

1D chain with open boundaries



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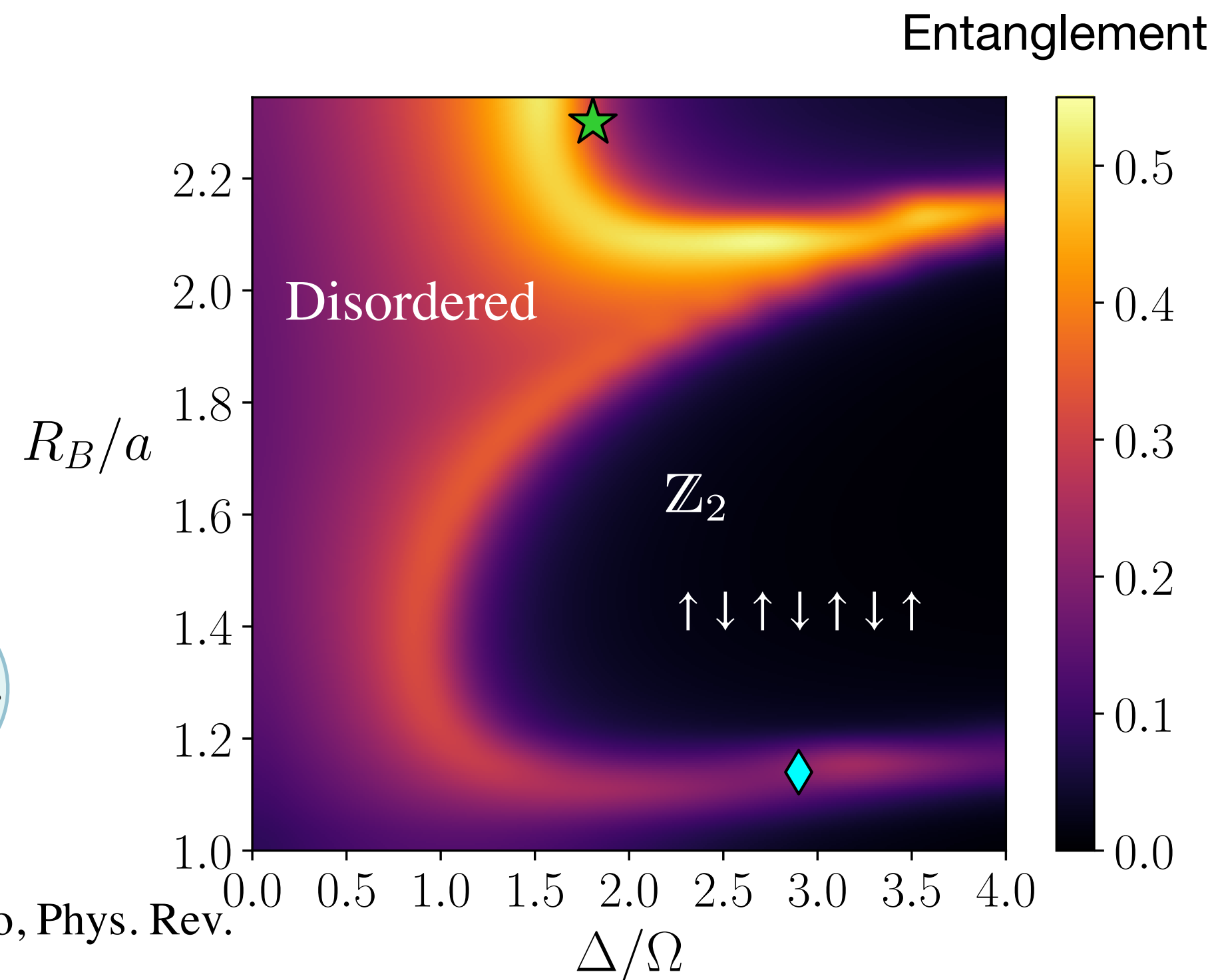
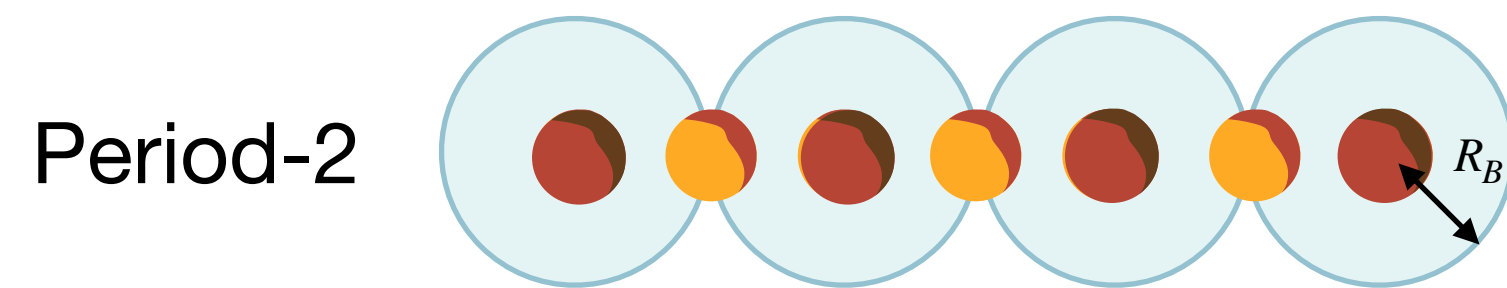
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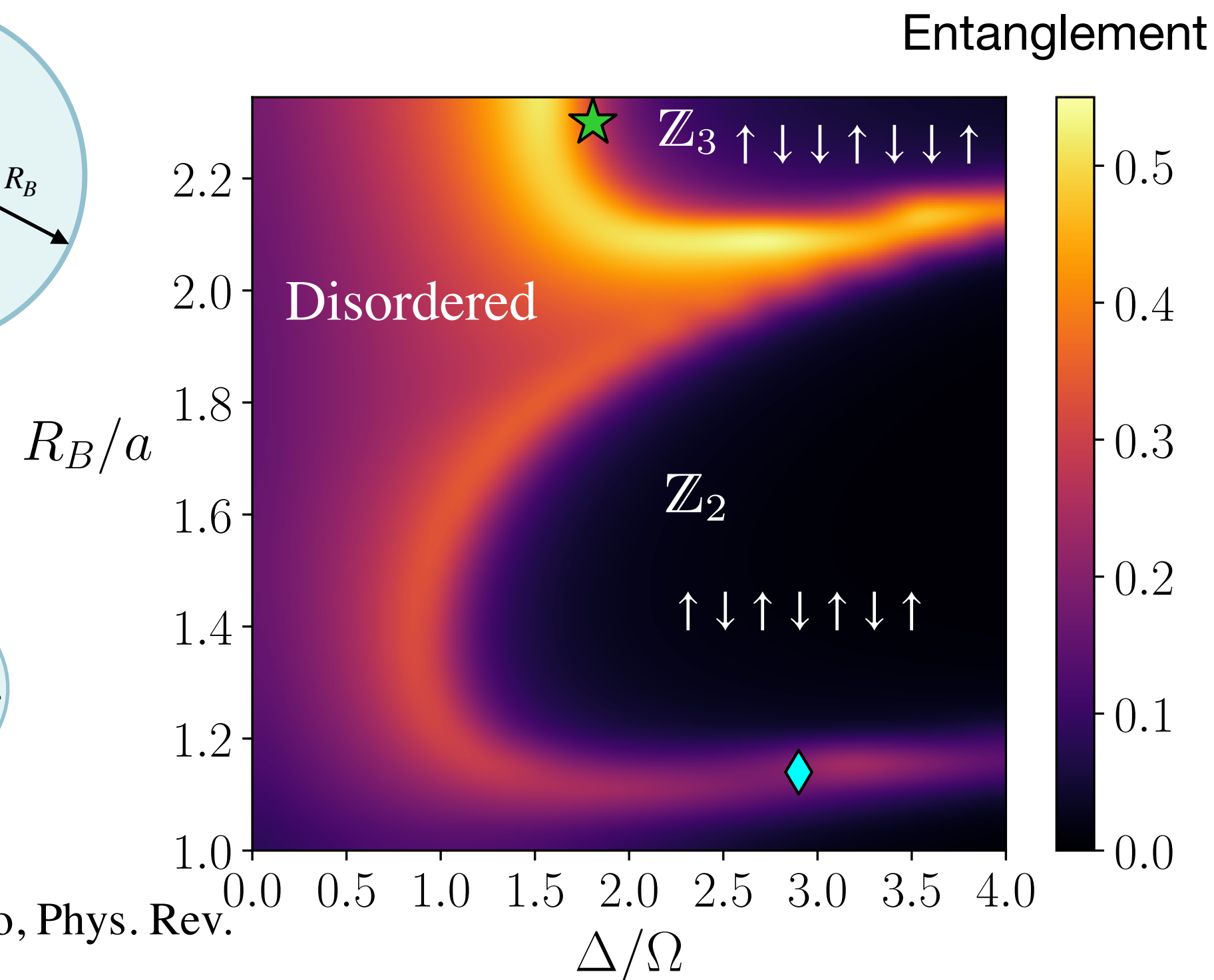
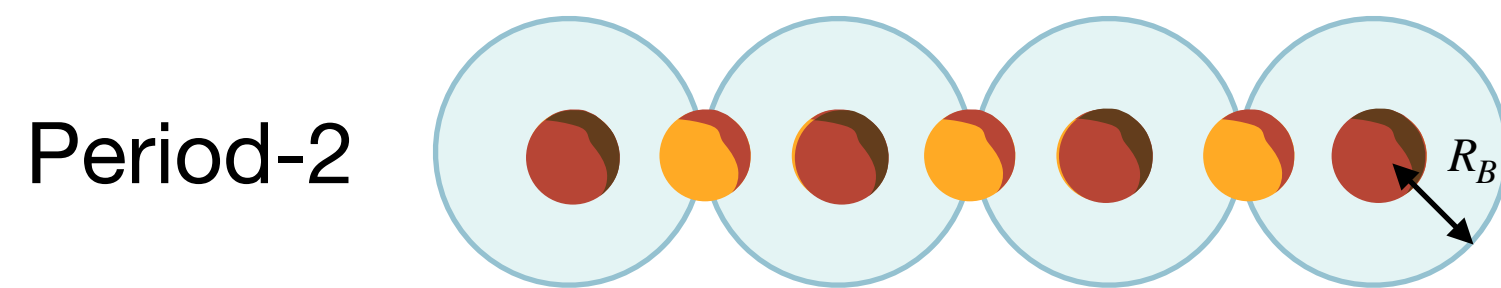
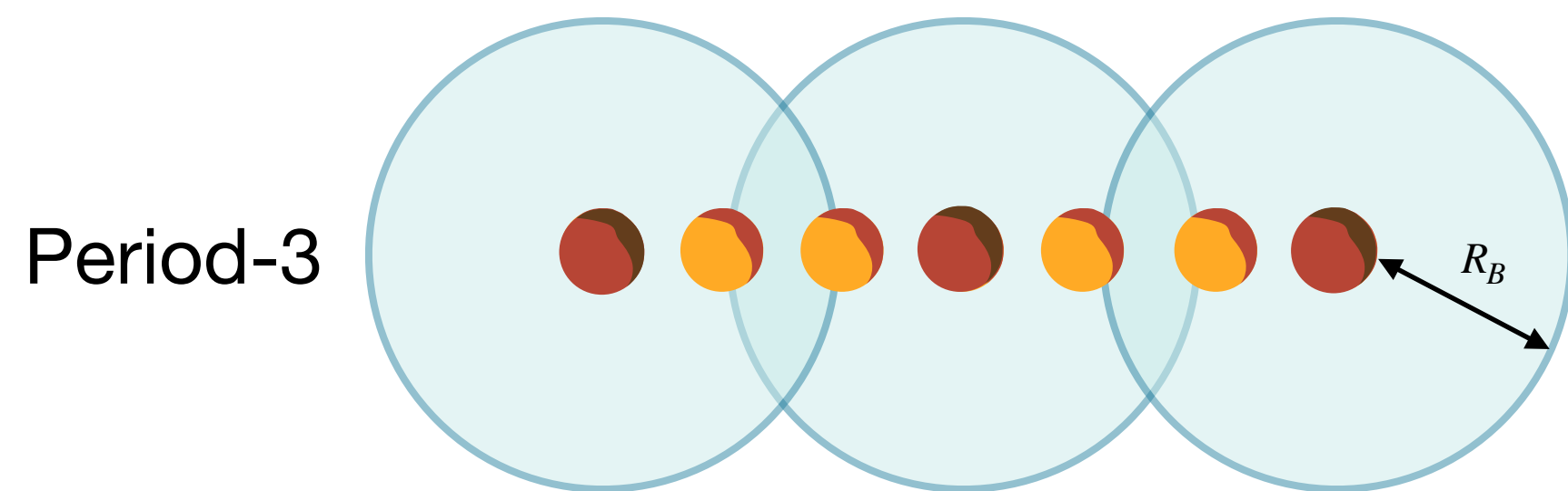
$\Delta$  - Detuning

$$\hat{H} = \underbrace{\frac{\Omega}{2} \sum_i \sigma_x^i - \Delta \sum_i n_z^i}_{\text{Laser terms}} + \underbrace{\sum_{i \neq j} \frac{C_6}{R_{ij}^6} n_z^i n_z^j}_{\text{Rydberg blockade mechanism}}$$

Blockade radius:

$$R_B = \sqrt[6]{\frac{C_6}{\Omega}}$$

1D chain with open boundaries



# Part 2: Finite-temperature Rydberg arrays

$$n_z = \frac{1}{2}(\sigma_z + 1)$$

$\Omega$  - Rabi frequency

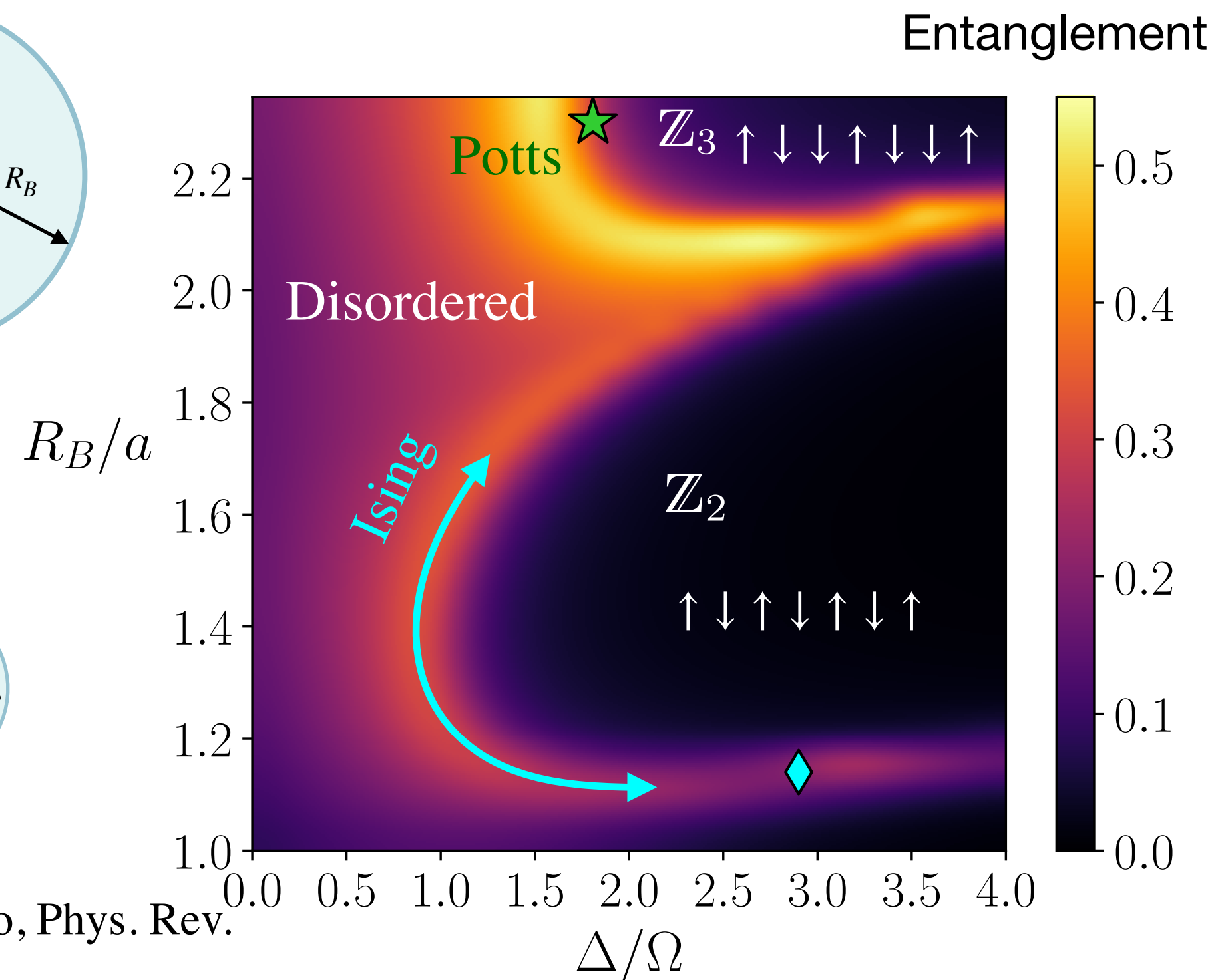
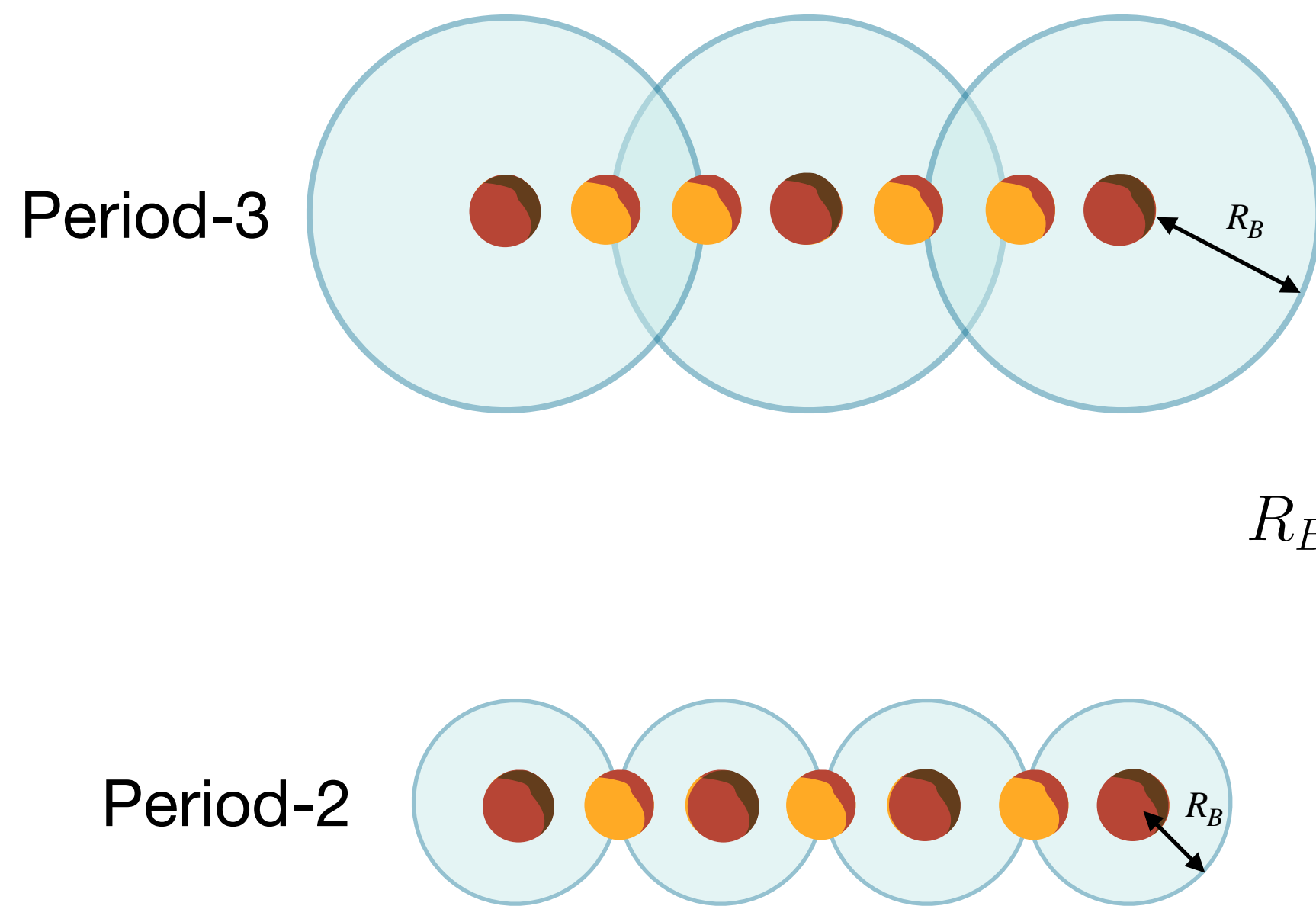
$\Delta$  - Detuning

$$\hat{H} = \underbrace{\frac{\Omega}{2} \sum_i \sigma_x^i - \Delta \sum_i n_z^i}_{\text{Laser terms}} + \underbrace{\sum_{i \neq j} \frac{C_6}{R_{ij}^6} n_z^i n_z^j}_{\text{Rydberg blockade mechanism}}$$

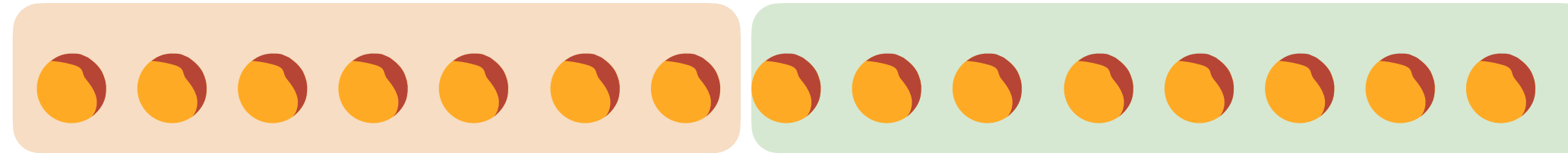
Blockade radius:

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1D chain with open boundaries



# Finite-temperature entanglement in Rydberg chain



Entanglement between the system's halves

**Zero temperature:**

**Pure-state entanglement:**  
entanglement entropy  $\mathcal{S}$

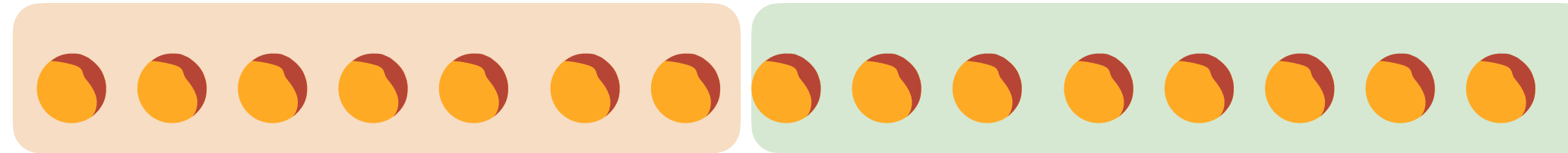
At quantum critical points:

$$\mathcal{S} \propto \frac{c}{6} \log(N)$$

Conformal field theory result  
for 1D with open boundaries



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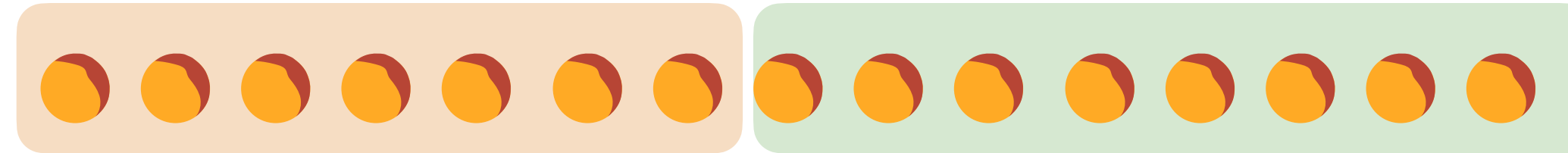
Conformal field theory result  
for 1D with open boundaries

**Finite temperature:**

Assumption: the scaling extends  
to the low-temperature regime

$$E_F = \frac{c}{6} \log(N) + g_F(TN^2)$$

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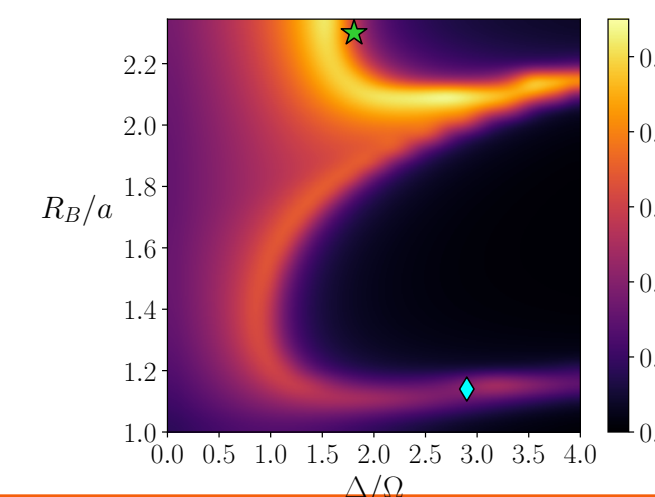
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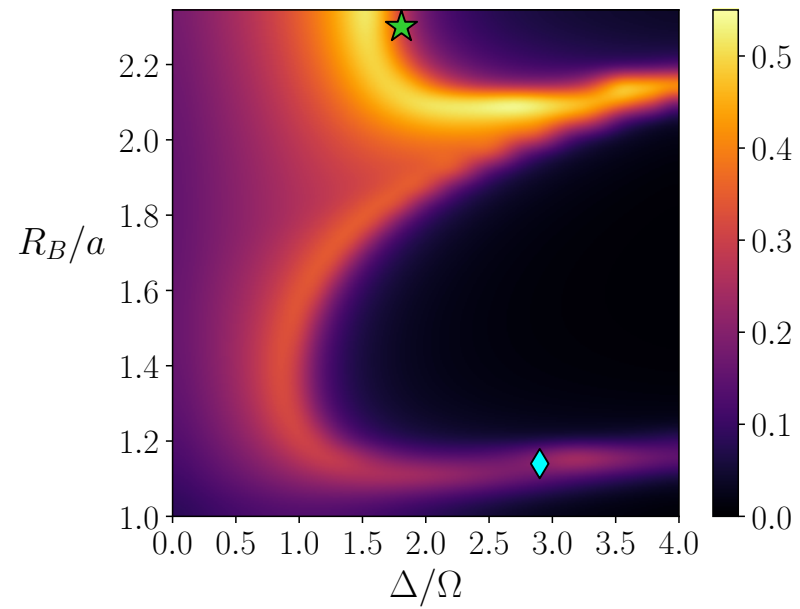
**We measure:**

- entanglement negativity
- entanglement of formation

At **Ising** and **Potts** quantum critical points

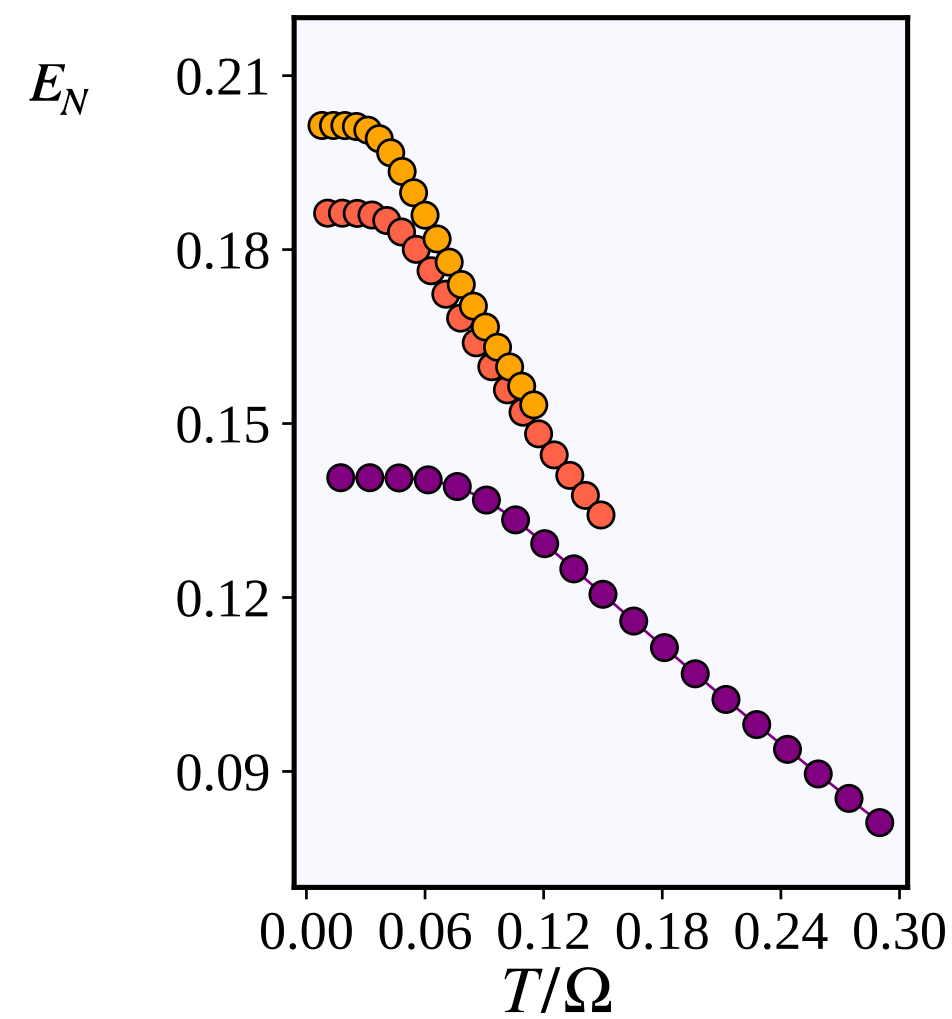


# Finite-temperature entanglement in Rydberg chain



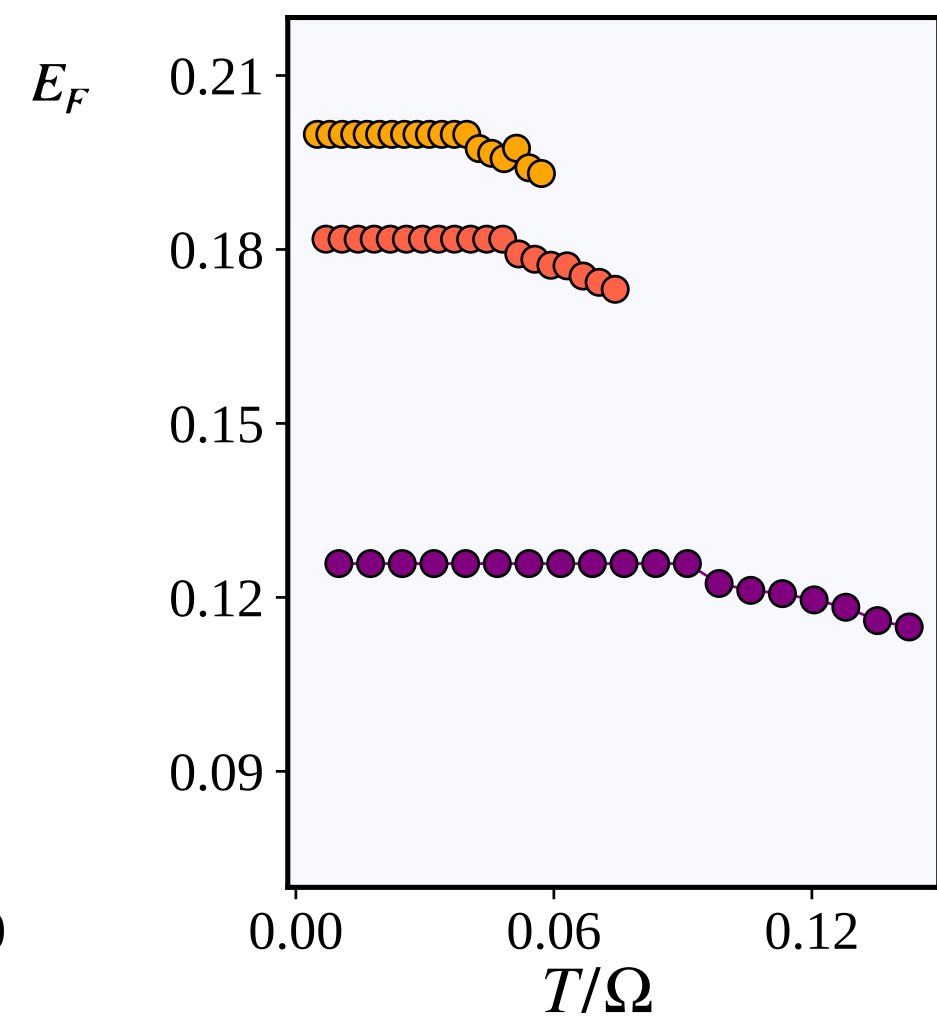
## Ising transition point

Entanglement negativity



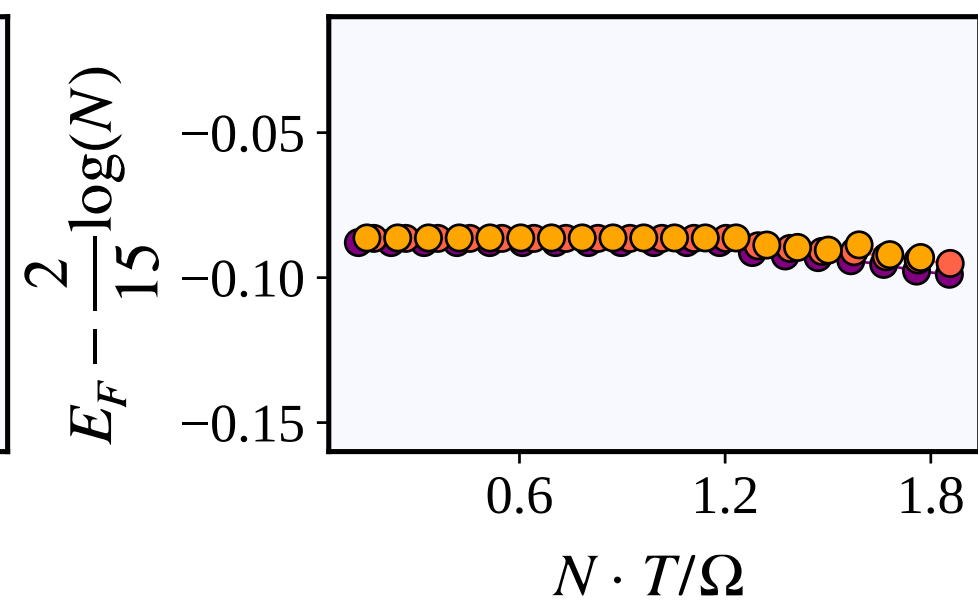
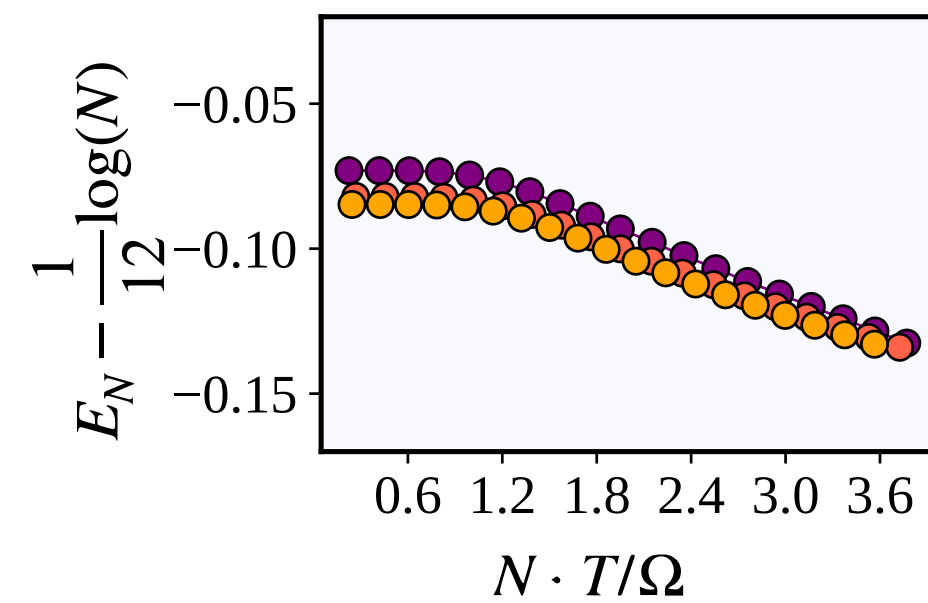
● N = 13 ● N = 25 ● N = 31

Entanglement of formation



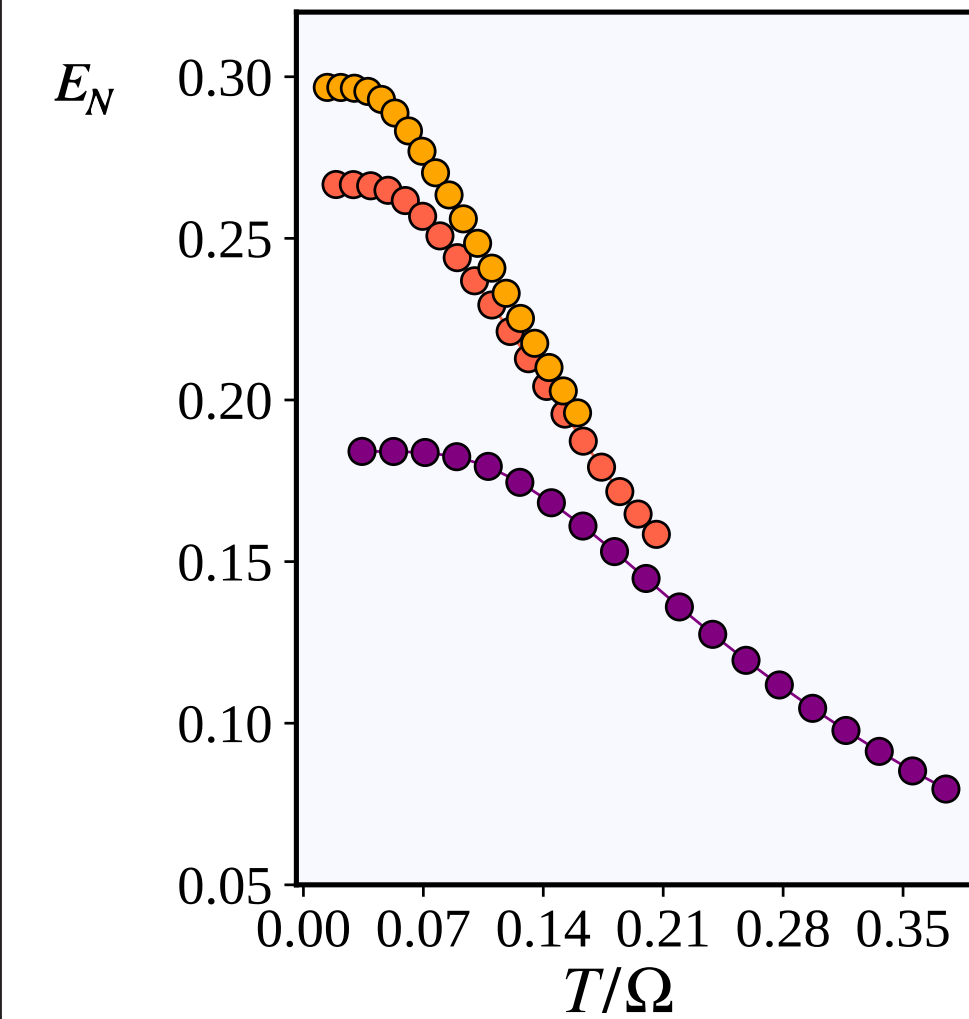
$$E_N = \frac{c}{6} \log(N) + g_N(TN^z)$$

$$E_F = \frac{c}{6} \log(N) + g_F(TN^z)$$



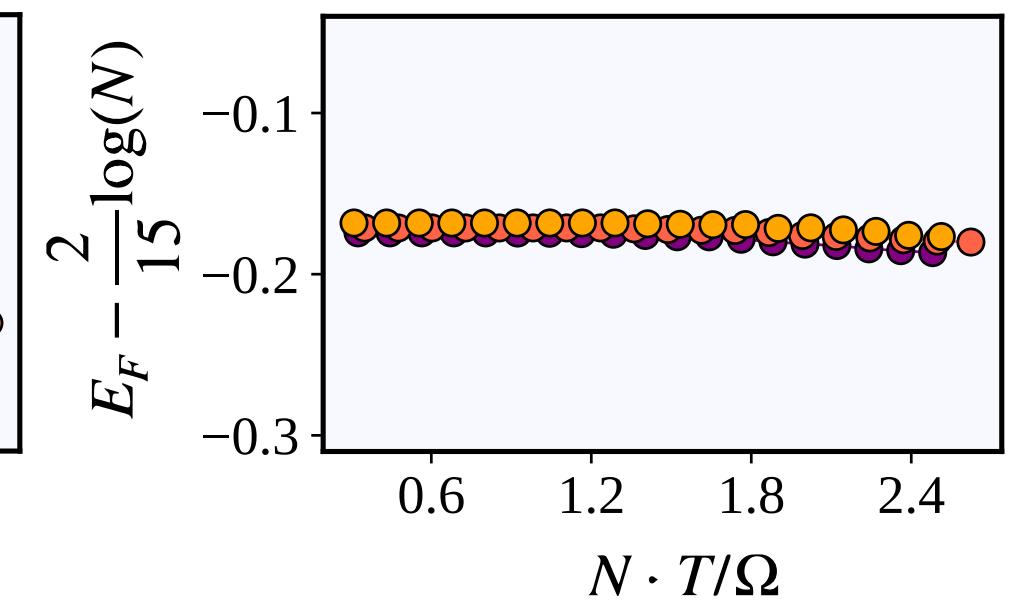
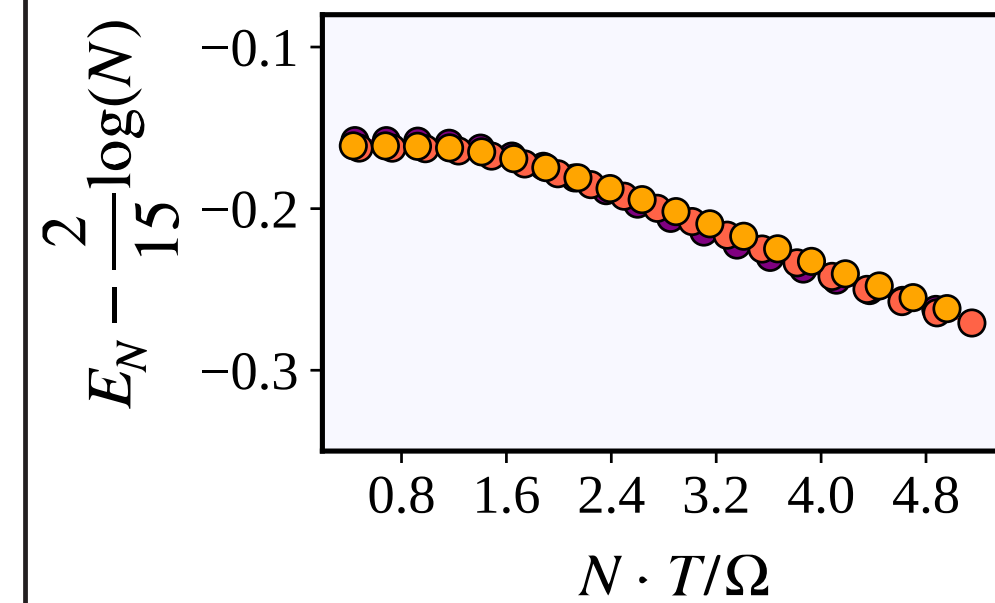
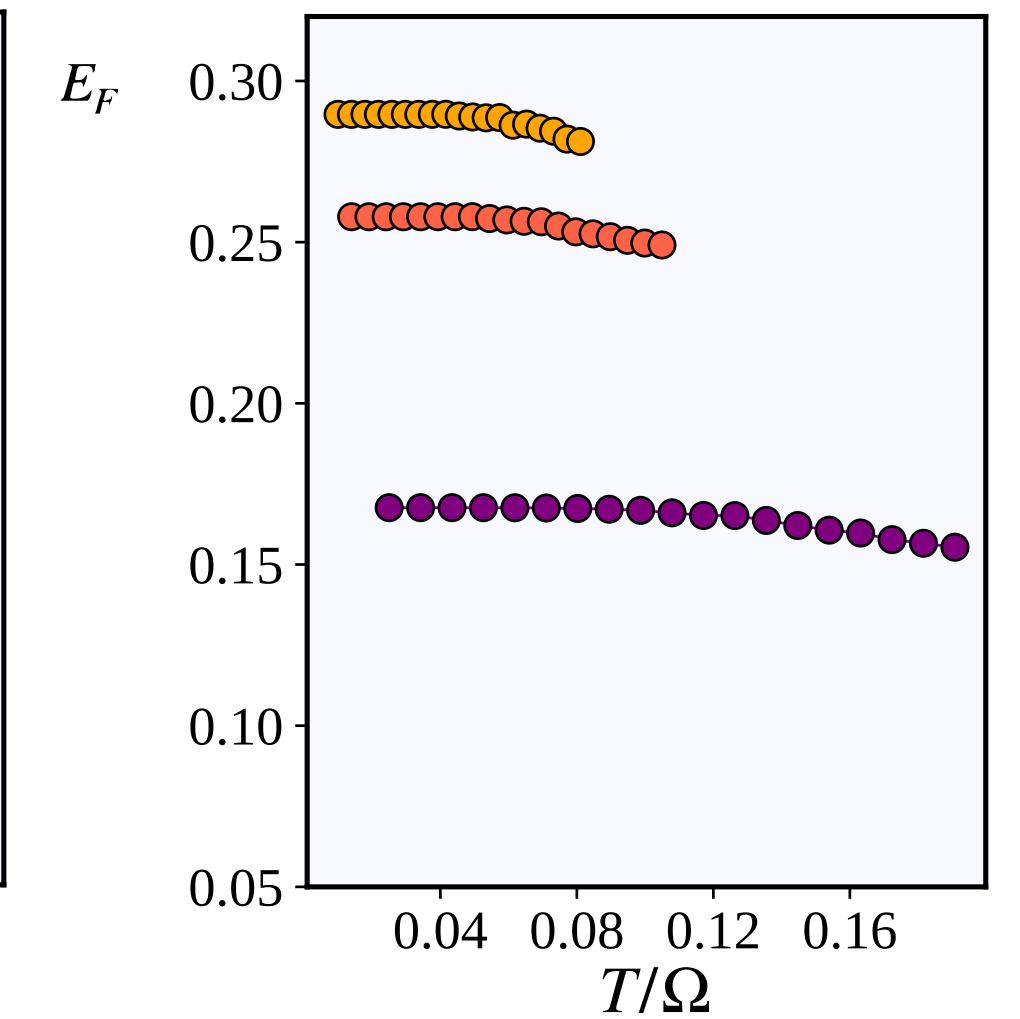
## Potts transition point

Entanglement negativity



● N = 13 ● N = 25 ● N = 31

Entanglement of formation



# Part 1& 2 - Conclusions

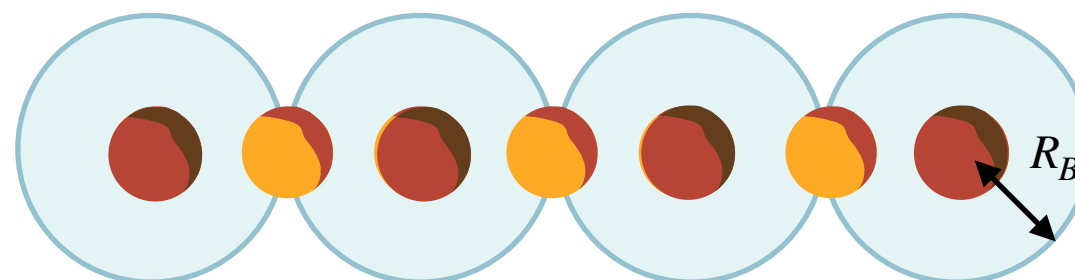
N. Reinić, D. Jaschke, D. Wanisch, P. Silvi, S. Montangero  
Phys. Rev. Research 6, 033322 (2024)

- **We developed the tree tensor operator numerical toolbox**



Mixed state entanglement, thermal probabilities  
Applicable to a general quantum many-body model

- Applied the algorithm on **Rydberg atom systems**
- Confirmed the **finite-temperature entanglement scaling law** at quantum critical points

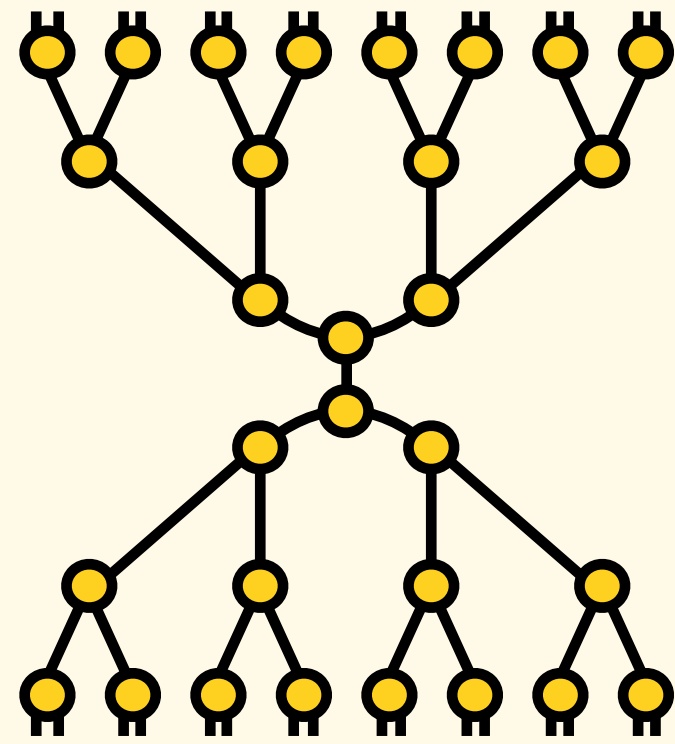


# Part 3: Energy spectrum extraction

(Preliminary)

# Excited states from thermal density matrix

Idea:



With tree tensor operator algorithm we have:

thermal probabilities  $p_j$

$$\rho = \sum_{j=1}^{K_0} p_j |\psi_j\rangle \langle \psi_j|$$

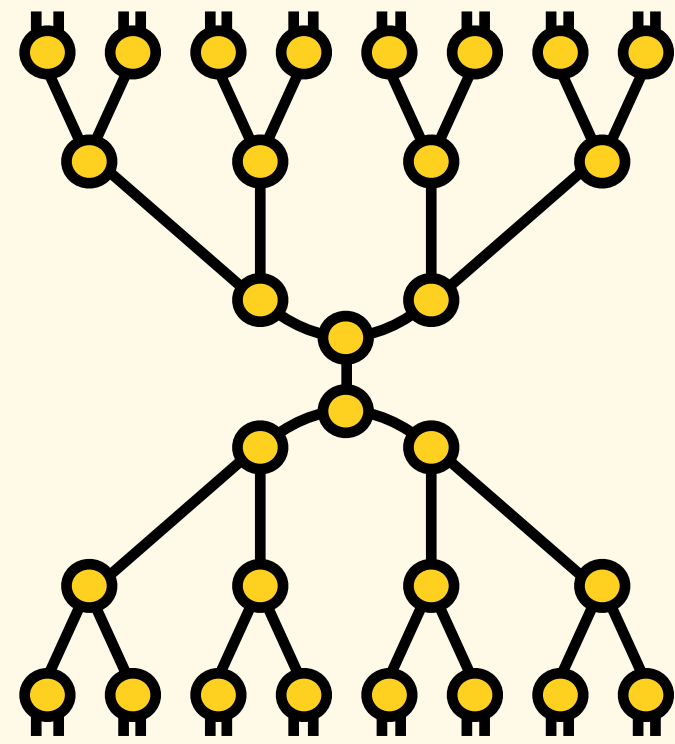
We know:

$$p_j = \frac{e^{-\beta E_j}}{Z} \quad \beta = \frac{1}{T}$$

$E_i$  = eigenenergies of Hamiltonian

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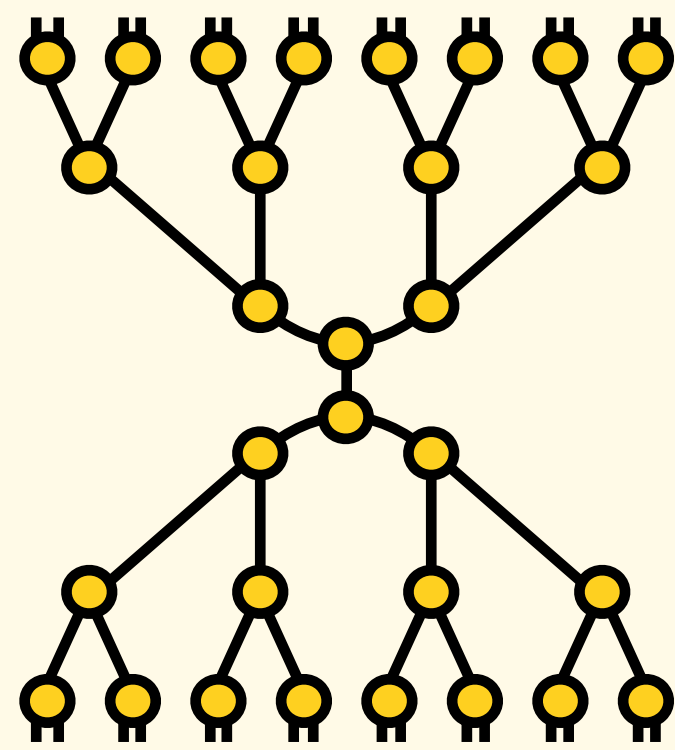
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$$\frac{p_{j+1}}{p_j} = e^{-\frac{1}{T}(E_{j+1} - E_j)} \quad E_{j+1} - E_j = \Delta_{j,j+1} = T \cdot \ln\left(\frac{p_j}{p_{j+1}}\right)$$

We have the direct access to the first  $(K_0 - 1)$  energy gaps!

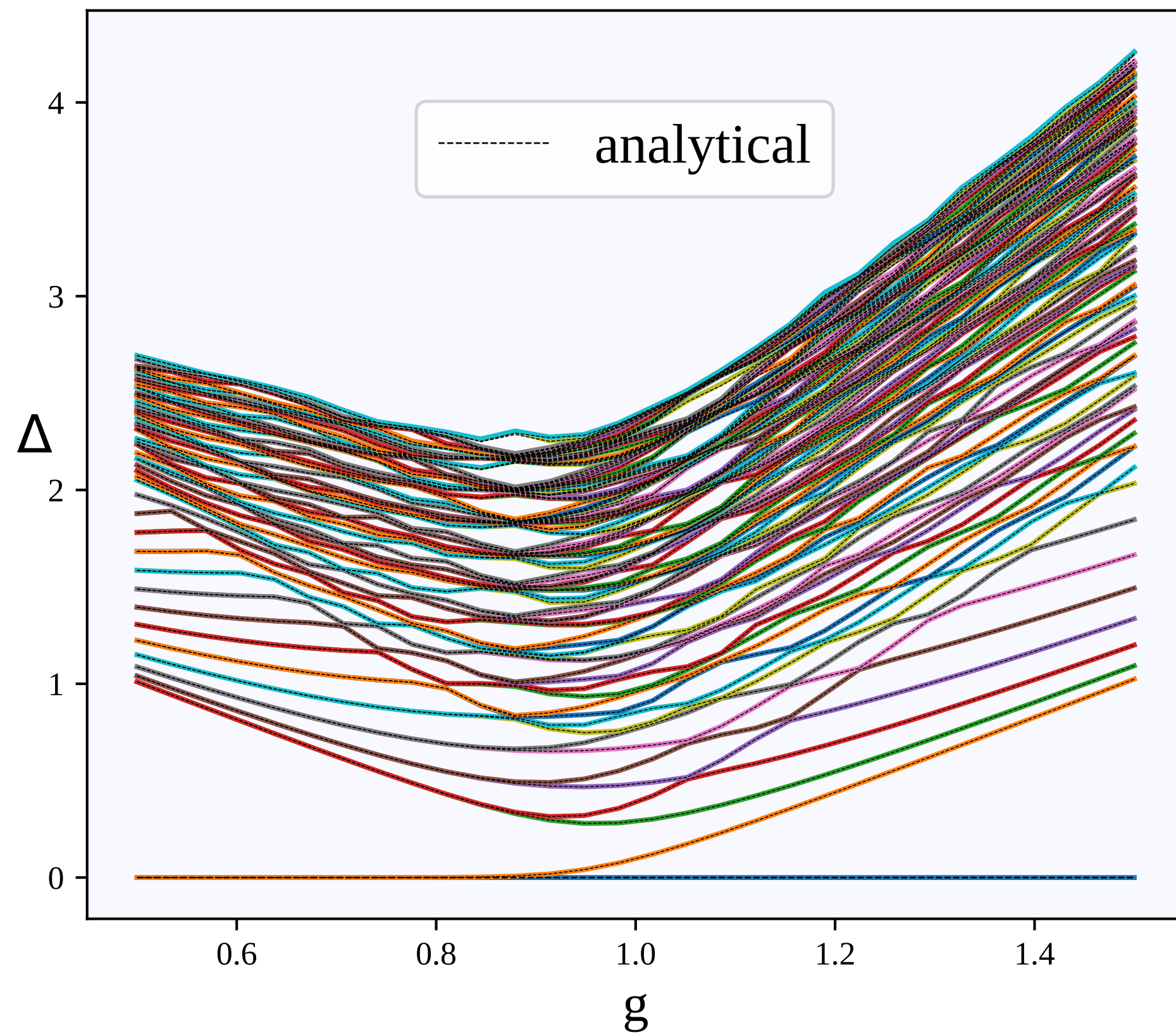


# Results

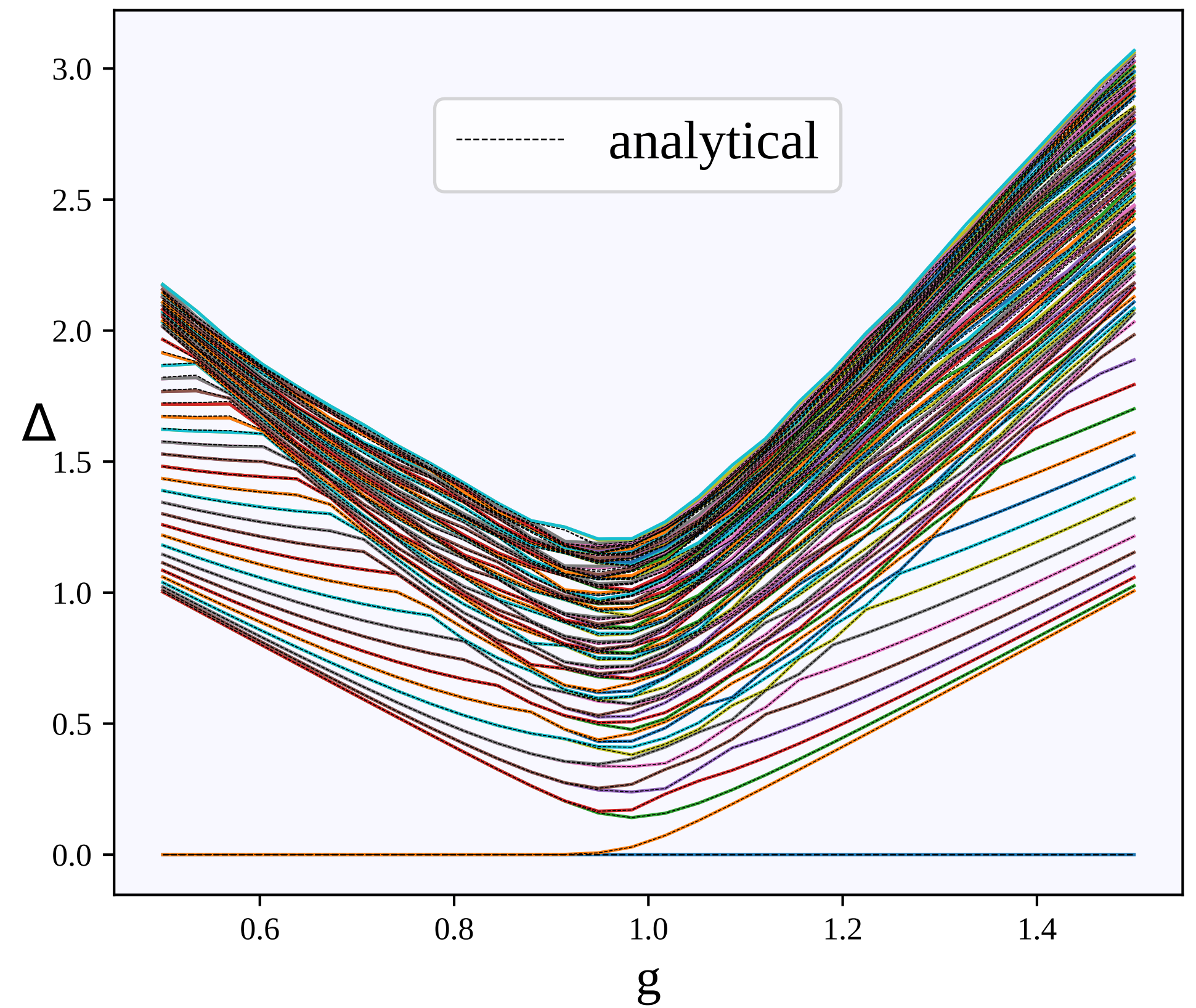
First 100 energy levels of quantum Ising 1D

$$H = - \sum_i \sigma_x^i \sigma_x^{i+1} + g \sum_i \sigma_z^i$$

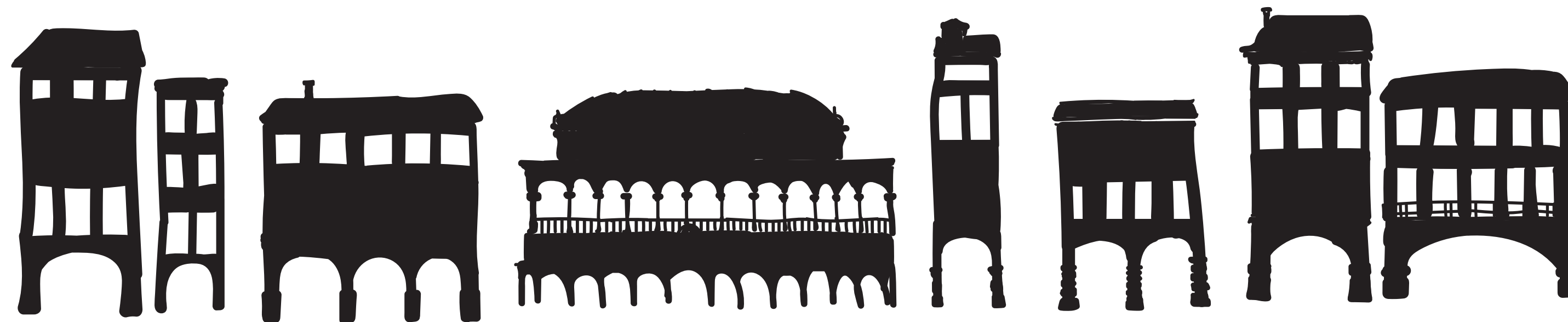
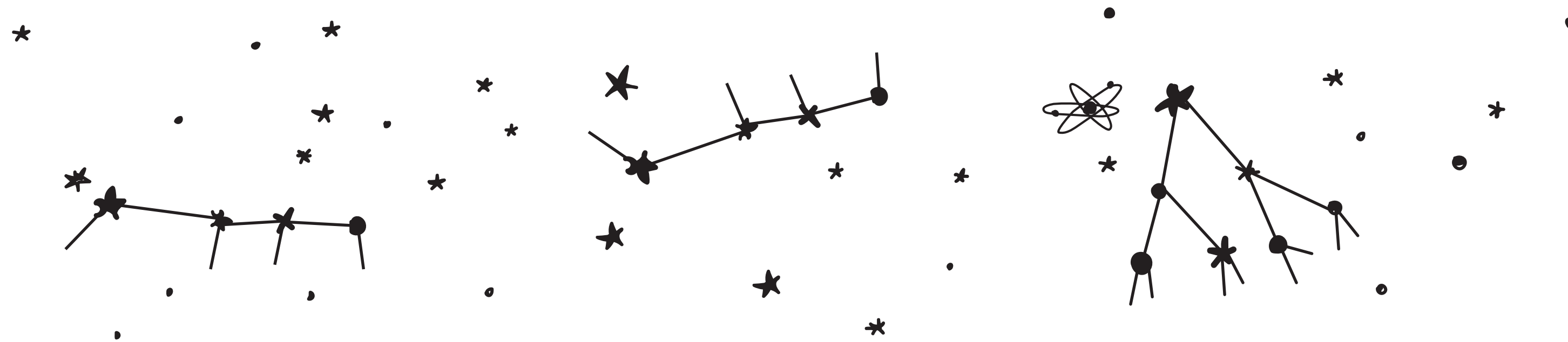
$N = 32$



$N = 64$



# Thank you for the attention!

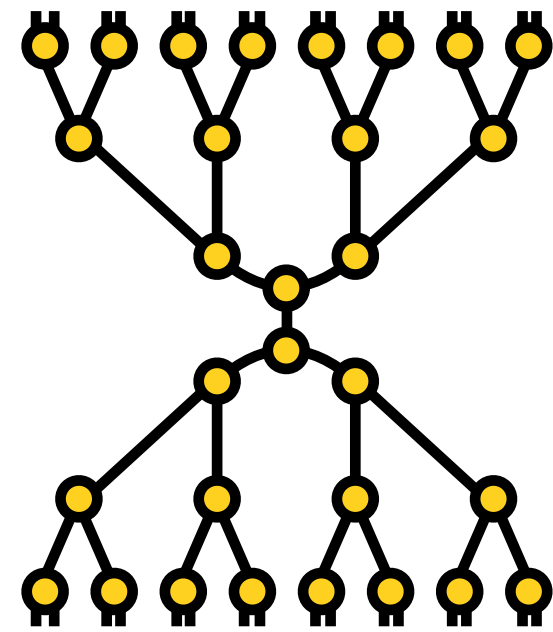


\*The research leading to these results has received funding from European Union's Horizon 2020 research and innovation programme under the Marie-Sklodowska Curie grant agreement no 101034319 and from the European Union - NextGenerationEU.

$$\rho = \sum_j p_j |\psi_j\rangle \langle \psi_j|$$

# Restriction on mixedness

Tree tensor operator  
(TTO)



Preserves **positivity** ✓

No restriction  
on **mixedness** ✗

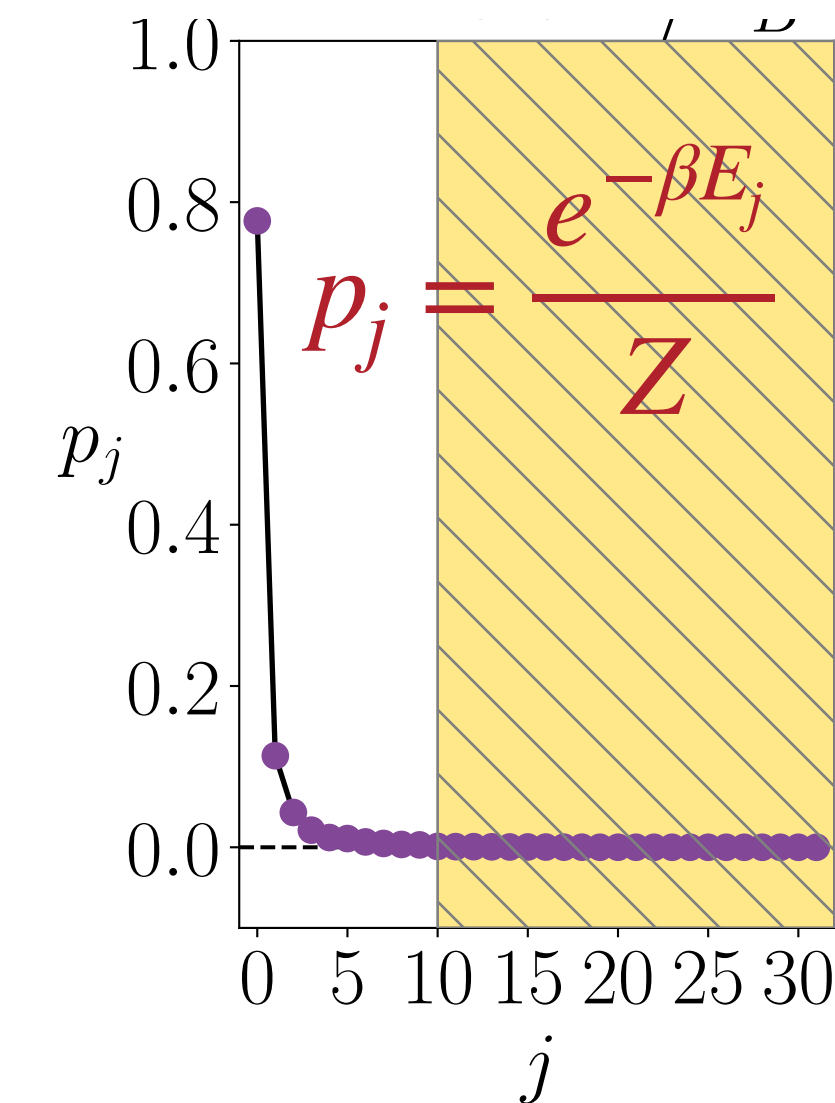
Access to local  
**observables** ✓

Access to  
**entanglement** ✓

Access to **eigenvalues**  
of density matrix ✓

Density matrix of thermal equilibrium states:

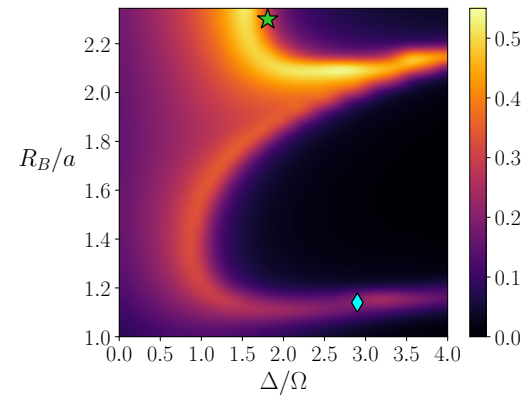
Thermal probabilities **decay exponentially** with the eigenenergies



**At low temperatures:**  
only the low-energy excited  
states will have non-negligible  
contribution

**Our physical states of interest are usually not very mixed**

# Ground state resilience to temperature



$T \approx 0$ :  
Pure ground state



$T \gg 0$ :  
Mixture of states

Up to which temperature can we expect the system to be in a ground state?

Temperature at which the **purity** falls below  $\gamma_{cut} = 0.9$ :

Temperature range:  $[0.025, 0.8] \frac{\Omega}{k_B}$

$\Omega = 2.5$  MHz



Temperature range:  $[3, 96] \mu K$

Usual experimental  
temperatures:  $\sim 10 \mu K$

