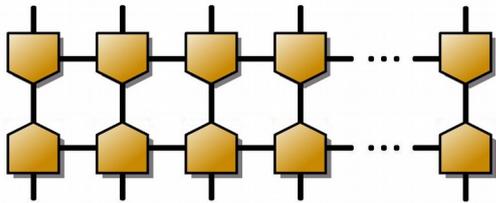
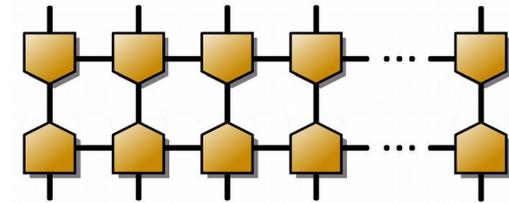


# Positive Tensor Network approach for simulating open quantum many-body systems



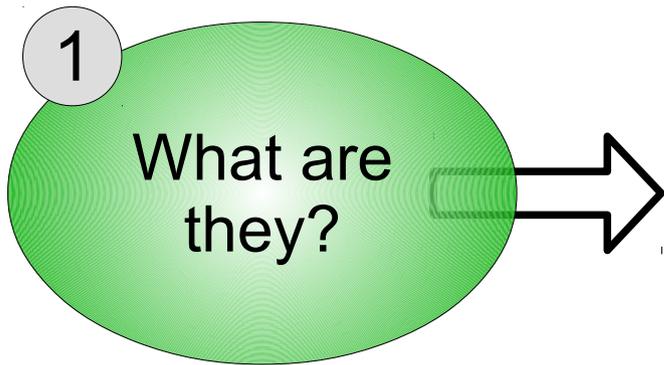
19 / 9 / 2016



A. Werner, D. Jaschke, P. Silvi, M. Kliesch,  
T. Calarco, J. Eisert and S. Montangero

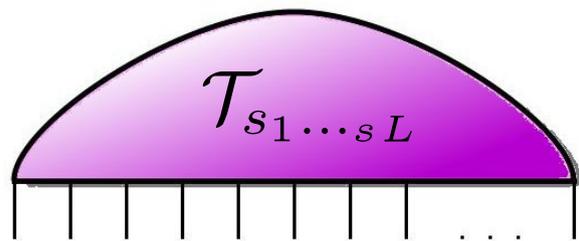
*PRL 116, 237201 (2016)*

# Tensor Network ansatz states:

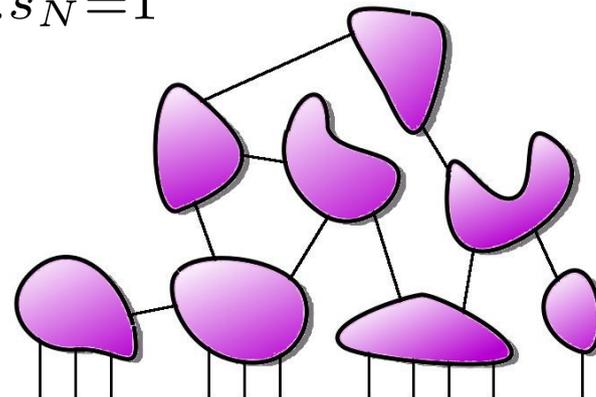


Classes of tailored variational quantum many-body wavefunctions

$$|\Psi\rangle = \sum_{s_1 \dots s_N=1}^d \mathcal{T}_{s_1 \dots s_N} |s_1, \dots, s_N\rangle$$



=



## Example<sup>1,2</sup>: Matrix Product States

$$\mathcal{T}_{s_1 \dots s_N} = \sum_{\alpha_2 \dots \alpha_N=1}^{\chi} A_{\alpha_2}^{[1]s_1} A_{\alpha_2, \alpha_3}^{[2]s_2} A_{\alpha_3, \alpha_4}^{[3]s_3} \dots A_{\alpha_N}^{[N]s_N} =$$

- 1) S. Romer, S. Ostlund; Phys. Rev. B **55**, 2164 (1997)
- 2) U. Schollwoeck, Annals of Physics **326**, 96 (2011)

# Tensor Network ansatz states:

2

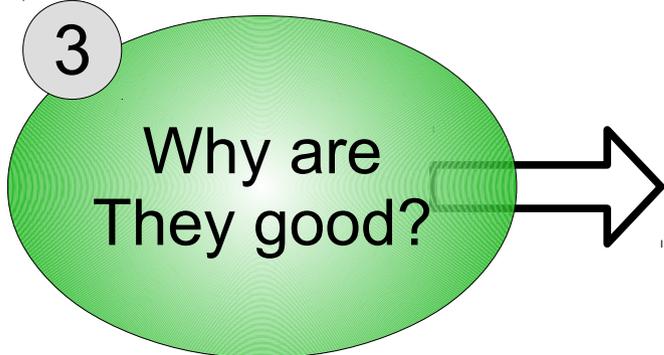
What are  
They good for?



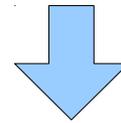
- Simulating ground states of 1D, 2D quantum lattices with OBC (DMRG<sup>3</sup>)
- ... with PBC
- ... in infinite systems
- Simulating out-of equilibrium dynamics

3

Why are  
They good?



Physical quantum many-body states obey precise **entanglement scaling laws**



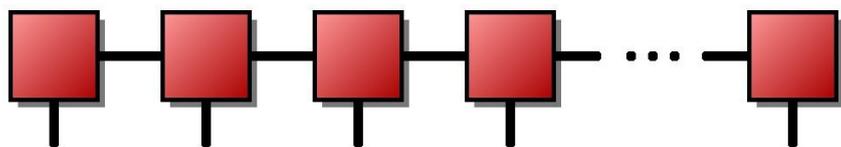
Tensor networks encode these states faithfully and efficiently

3) S. White; Phys. Rev. Lett. **69**, 2863 (1992)

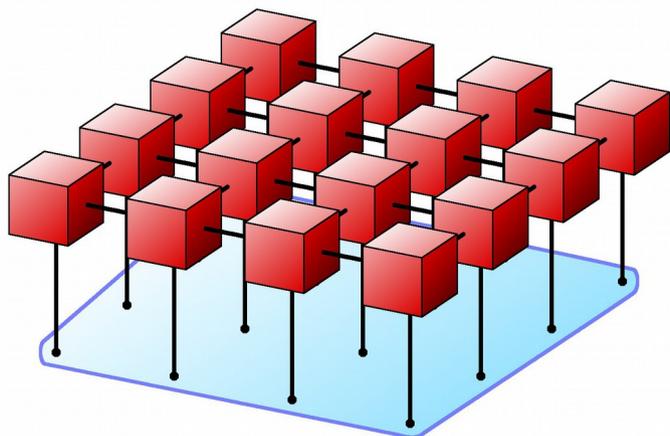


# Zoology of Tensor Networks:

Matrix Product States (MPS)

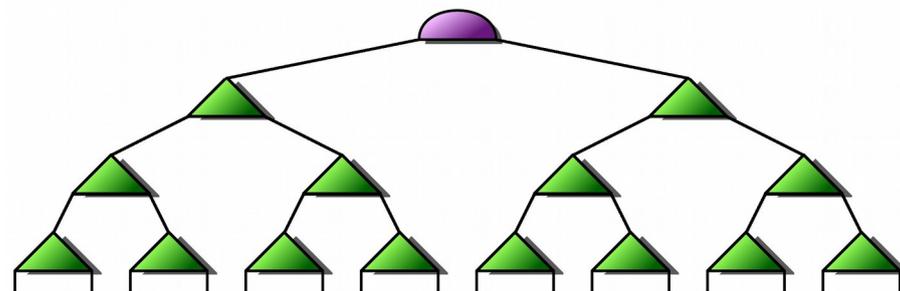


Projected Entangled Pair States (PEPS)<sup>4</sup>

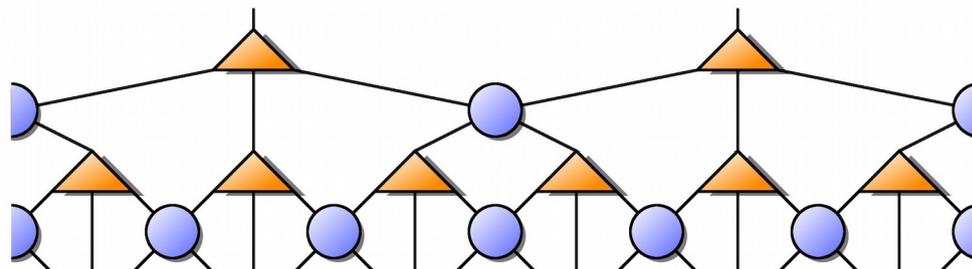


...and many more.

Tree Tensor Networks



Multiscale Entanglement Renormalization Ansatz (MERA)<sup>5</sup>



4) Verstraete, Wolf, Perez-Garcia, Cirac; PRL **96**, 220601 (2006)

5) G. Vidal; PRL **99**, 220405 (2007)

# Motivation:

We want to extend the known quantum many-body (QMB) dynamics algorithms to encompass **Open Systems**.

The focus is:

- Disregard reservoir dynamics
- Capture both transient and steady behavior
- Stay numerically efficient and control precision/errors

## Pathways

- 1) *Stochastic unravelling* of pure TN-state dynamics (quantum jumps, quantum trajectories)
- 2) Extend TN-states to describe *density matrices*

# Pathway A: Quantum Jumps

Sample several pure states and simulate stochastic trajectories according to (at first order)<sup>6</sup>:

$$|\psi(t + \delta t)\rangle = \begin{cases} \frac{e^{iH_{\text{eff}}\delta t} |\psi(t)\rangle}{\sqrt{P}} & \text{with } P = 1 - \sum_j p_j \\ \frac{L_j |\psi(t)\rangle}{\sqrt{p_j/\delta t}} & \text{with } p_j = \delta t \langle \psi(t) | L_j^\dagger L_j | \psi(t) \rangle \end{cases}$$

Where  $H_{\text{eff}} = H - \frac{i}{2} \sum_j L_j^\dagger L_j$  and Lindbladians  $L_j$

Perform dynamics simulations with Tensor Networks.  
*Reconstruct* full dynamics by averaging over the samples.

6) A. J. Daley; Adv. Phys. **63**, 77 (2014)

# Pathway B: QMB Density Matrices

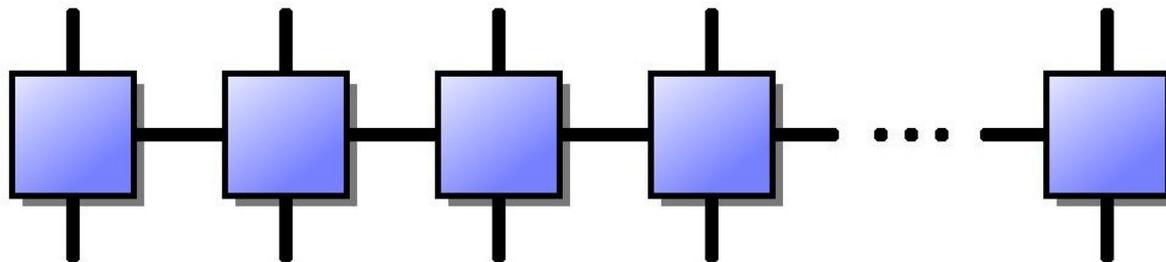
$$\rho = \sum_{s_1 \dots s_L} \sum_{r_1 \dots r_N} \mathcal{T}_{s_1 \dots s_N}^{r_1 \dots r_N} |s_1, \dots, s_N\rangle \langle r_1, \dots, r_N|$$

writing  $\mathcal{T}_{s_1 \dots s_N}^{r_1 \dots r_N}$  as a tensor network.

## A viable way: the MPDO

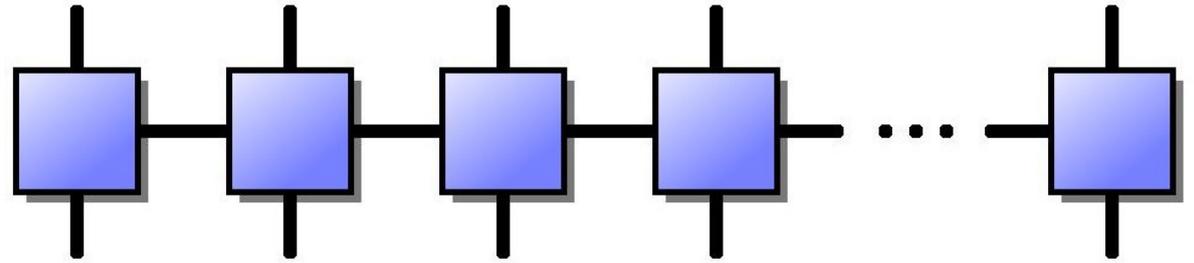
A possible path to do so is with Matrix Product (Density) Operators: MPDO<sup>7</sup>

$$\mathcal{T}_{s_1 \dots s_N}^{r_1 \dots r_N} = \sum_{\alpha_2 \dots \alpha_N = 1}^{\chi} A_{\alpha_2}^{[1]s_1, r_1} A_{\alpha_2, \alpha_3}^{[2]s_2, r_2} A_{\alpha_3, \alpha_4}^{[3]s_3, r_3} \dots A_{\alpha_N}^{[N]s_L, r_N} =$$



7) Verstraete, Cirac; PRL **93**, 207204 (2004). Zwolak, Vidal; PRL **93**, 207205 (2004)

## The MPDO way



### Features:

- Finite Temperature states of short-range Hamiltonian
- Can simulate open-system dynamics
- Direct targeting of steady states<sup>8</sup>

### Drawback:

Positivity is not guaranteed (**positivity check is NP-hard**).

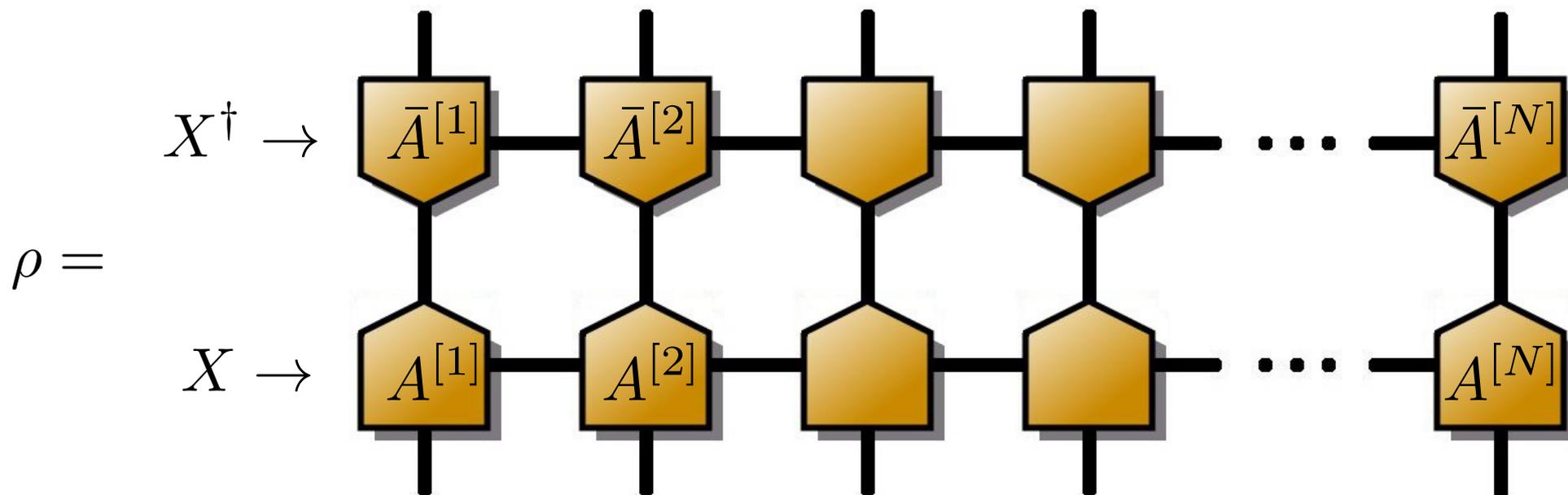
8) J. Cui, I. Cirac, M. C. Banuls; Phys. Rev. Lett. **114**, 220601 (2015)

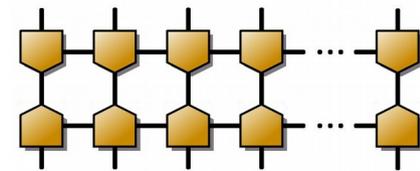
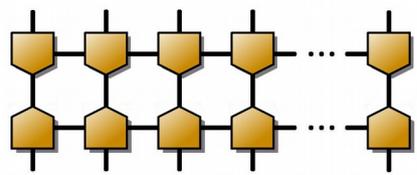
How can we impose positivity in a natural way?

Simple trick: write the density matrix as

$$\rho = X X^\dagger$$

where  $X$  is a many-body operator, which we can write as a matrix product operator





# Locally Purified Tensor Network (LPTN)

Why this name<sup>9</sup>?

Assume to extend the  $L$  system sites with  $L$  ancillary sites

$$|X\rangle\rangle = \sum_{s_1 \dots s_N}^d \sum_{q_1 \dots q_N}^K X_{s_1 \dots s_N}^{q_1 \dots q_N} |s_1 \dots s_N\rangle_{\text{system}} \otimes |q_1 \dots q_N\rangle_{\text{ancilla}}$$

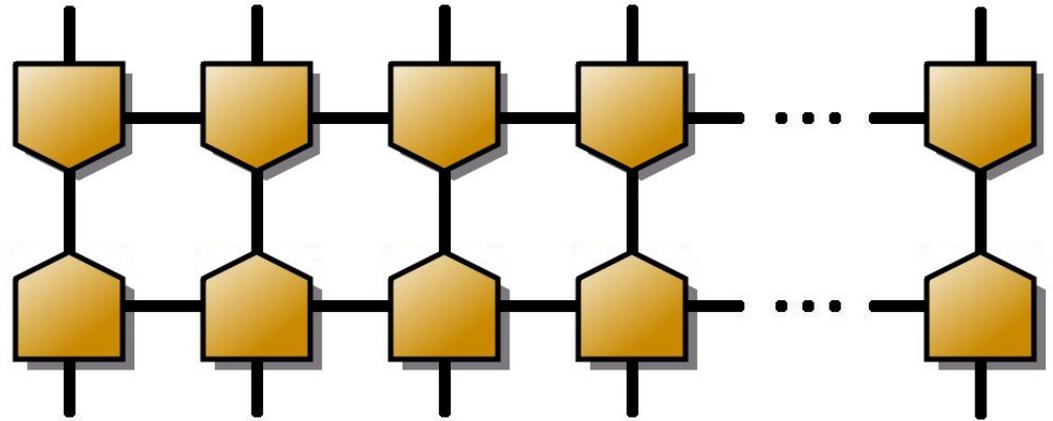
If we now disregard (trace away) the ancillas, we get

$$\rho = \text{Tr}_{\text{ancilla}} [ |X\rangle\rangle \langle\langle X| ] = X X^\dagger$$

We have a purification representation where every site has a dedicated bath (of dimension  $K$ ).

9) G. De las Cuevas, N. Schuch, D. Perez-Garcia, I.J. Cirac; NJP **15**, 123021 (2013)

## The LPTN way



## 😊 Features:

- Finite Temperature states 
- Can simulate open-system transient dynamics (steady states are reached dynamically) 
- Positivity always guaranteed 

## 😞 Issues:

**Variational constraint:** algorithms must preserve the symmetry  $X \leftrightarrow X^\dagger$  at all times.

# Markovian dynamics with LPTN

And now something familiar...

$$\frac{d\rho}{dt} = i[\rho, H] + \sum_j \left( L_j \rho L_j^\dagger - \frac{1}{2} \{ \rho, L_j^\dagger L_j \} \right)$$

with the following conditions:

- Hamiltonian is short-range (nearest-neighbour interactions):

$$H = \sum_j h_{j,j+1}$$

- Lindbladians are local (single site)

Extensible to n-n two-site Lindbladians (not in this talk).

Liouville representation will help us

$$\frac{d|\rho\rangle\rangle}{dt} = (-iH \otimes \mathbb{I} + i\mathbb{I} \otimes H^T + \mathcal{D}_j) |\rho\rangle\rangle = \mathcal{L}|\rho\rangle\rangle$$

$$\rho \rightarrow |\rho\rangle\rangle$$

$$A\rho B \rightarrow A \otimes B^T |\rho\rangle\rangle$$

where 
$$\mathcal{D}_j = L_j \otimes \bar{L}_j - \frac{1}{2}L_j^\dagger L_j \otimes \mathbb{I} - \frac{1}{2}\mathbb{I} \otimes L_j^T \bar{L}_j$$

Because now we discretize the time in finite small intervals  $\delta t$ , and solve the real-time dynamics:

$$|\rho(t + \delta t)\rangle\rangle = \exp(\delta t \mathcal{L}) |\rho(t)\rangle\rangle$$

The Algorithm now focuses on how to implement  $\exp(\delta t \mathcal{L})$  on the LPTN state **efficiently** and **controlling errors**.

# Suzuki-Trotter decomposition

At second order, with three operators:

$$e^{\delta t(A+B+C)} = e^{\frac{\delta t}{2}A} e^{\frac{\delta t}{2}B} e^{\delta t C} e^{\frac{\delta t}{2}B} e^{\frac{\delta t}{2}A} + O(\delta t^3)$$

which follows from Baker-Hausdorff formulas.

---

Let us decompose  $\mathcal{L}$  in 3 pieces:  $\mathcal{L} = \mathcal{L}_1 + \mathcal{L}_2 + \mathcal{L}_3$

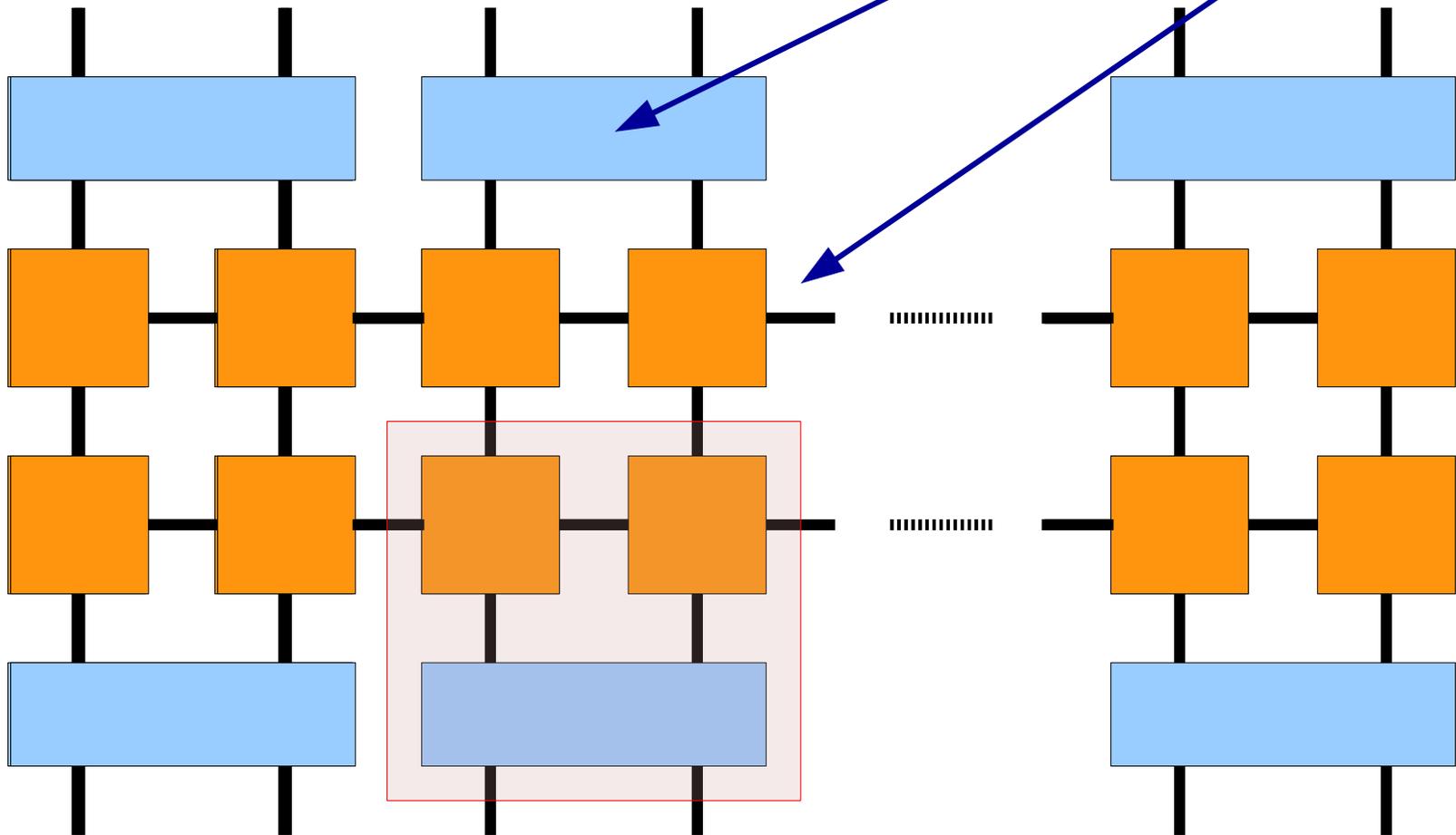
1) Odd-even Hamiltonian  $\mathcal{L}_1 = i \sum_j (h_{2j-1,2j} \otimes \mathbb{I} - \mathbb{I} \otimes h_{2j-1,2j}^T)$

2) Even-odd Hamiltonian  $\mathcal{L}_2 = i \sum_j (h_{2j,2j+1} \otimes \mathbb{I} - \mathbb{I} \otimes h_{2j,2j+1}^T)$

3) All dissipators  $\mathcal{L}_3 = \sum_j \mathcal{D}_j$

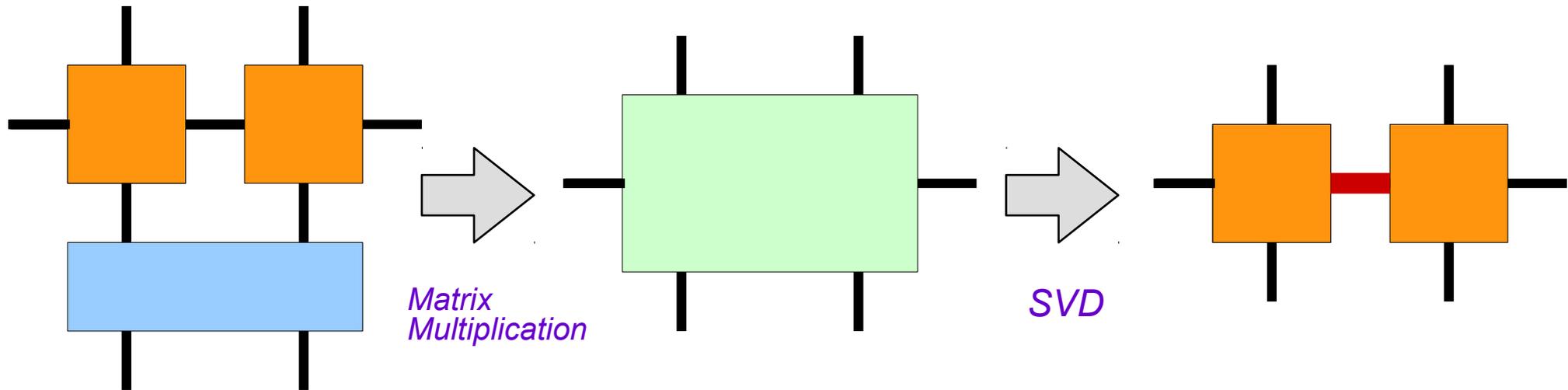
Advantage: each piece is made of commuting terms, therefore

$$e^{\delta t \mathcal{L}_1} |\rho\rangle\rangle = \bigotimes_j \left( e^{-i\delta t h_{2j-1,2j}} \otimes e^{i\delta t \bar{h}_{2j-1,2j}} \right) |\rho\rangle\rangle$$



**Notice:** This operation fulfills automatically the top-bottom symmetry requirement.

We need to perform the following linear algebra operation

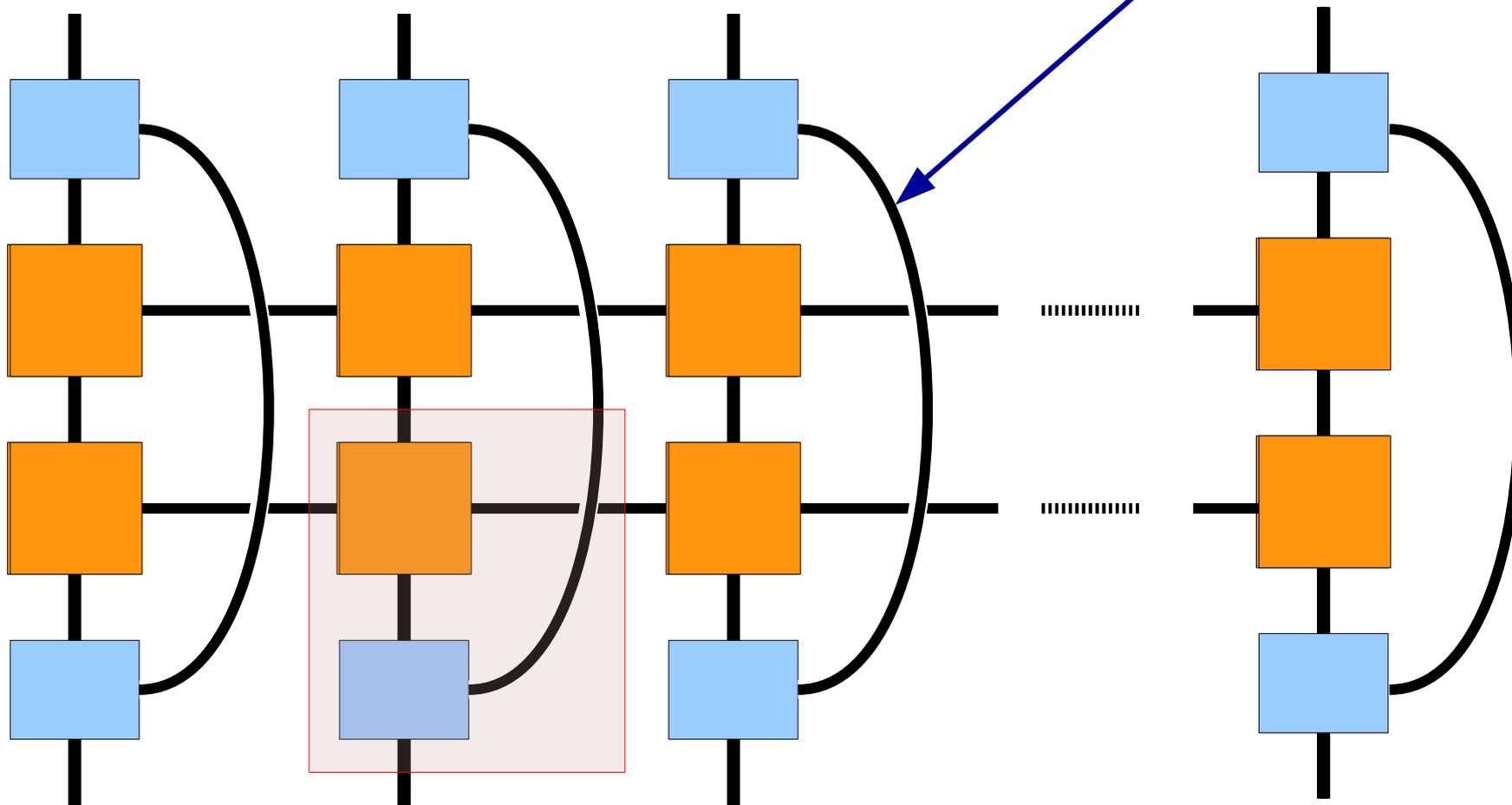


After this operation, the “correlation” bond (dimension of the tensors) is enlarged:

We “compress” it by discarding the smallest values in the singular value decomposition (**second source of error**).

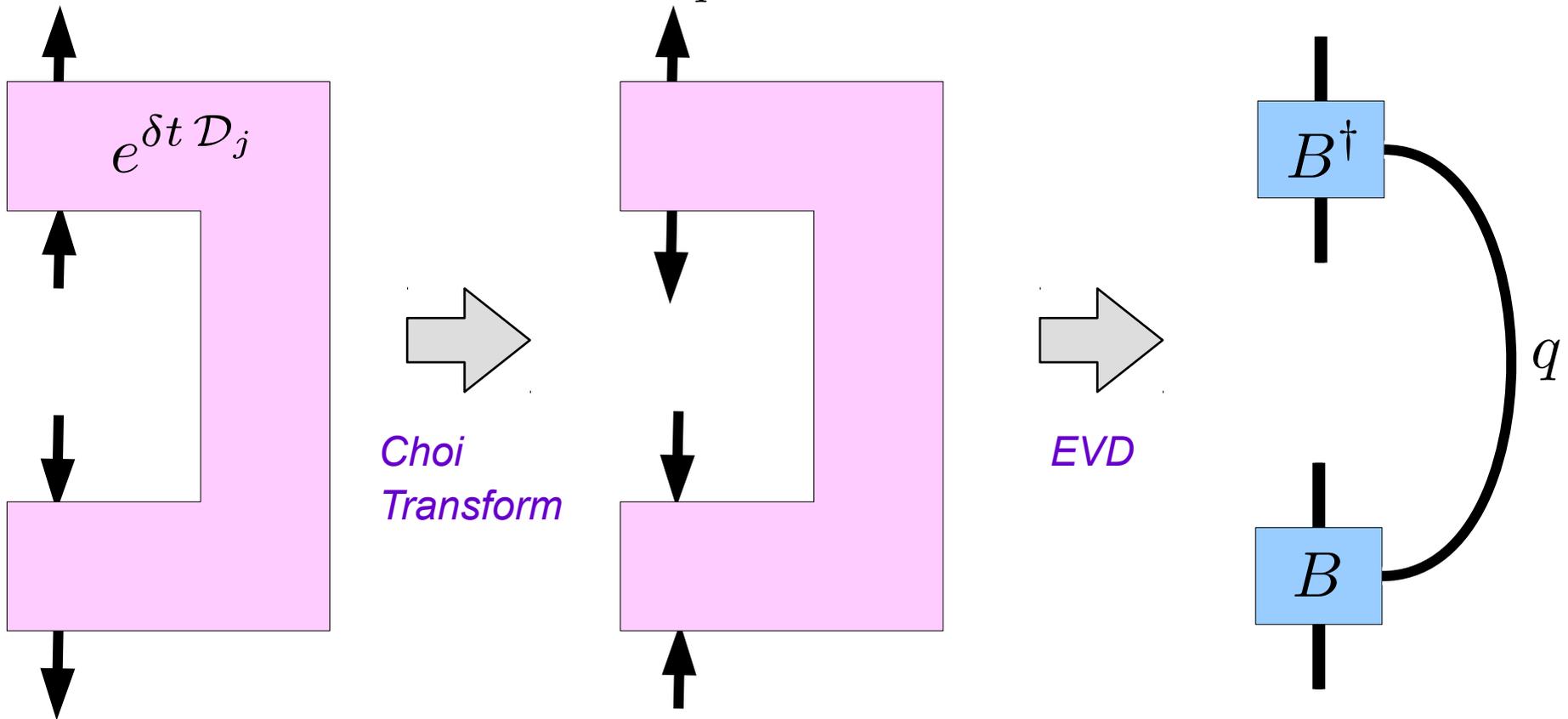
$\mathcal{L}_2$  is performed analogously to  $\mathcal{L}_1$ .

$\mathcal{L}_3$  requires a bit of care:  $e^{\delta t \mathcal{L}_3} |\rho\rangle\rangle = \bigotimes_j (e^{\delta t \mathcal{D}_j}) |\rho\rangle\rangle$



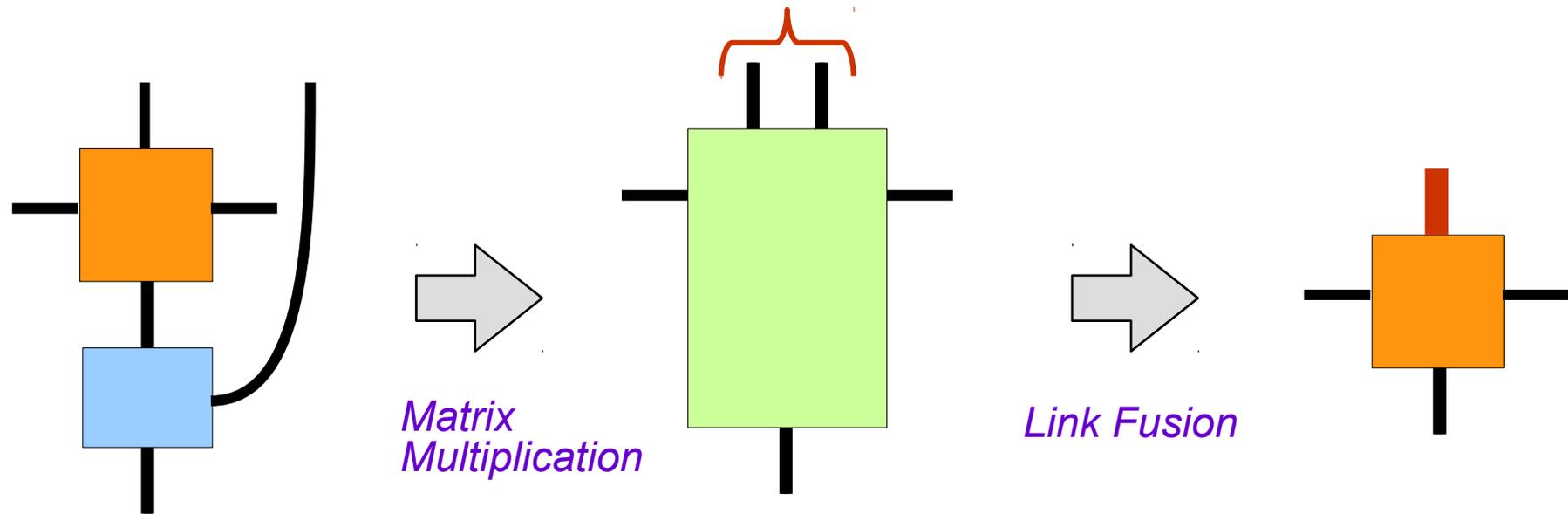
We numerically obtain the Kraus decomposition of the local dissipation quantum channel  $e^{\delta t \mathcal{D}_j}$ , which is CPT.

$$e^{\delta t \mathcal{D}_j} = \sum_q^{K'} B_q \otimes \bar{B}_q$$



**Notice:** The Kraus-decomposed map satisfies the top-bottom symmetry requirement.

The only operation left to perform is:



This time, the “bath” bond is enlarged. We can compress it again via SVD and truncation of the smallest singular values.

Algorithm Complete ! ✓

Apologies for being so technical, but that's my job.

# Benchmarks

It is high time to prove that our algorithm works well.

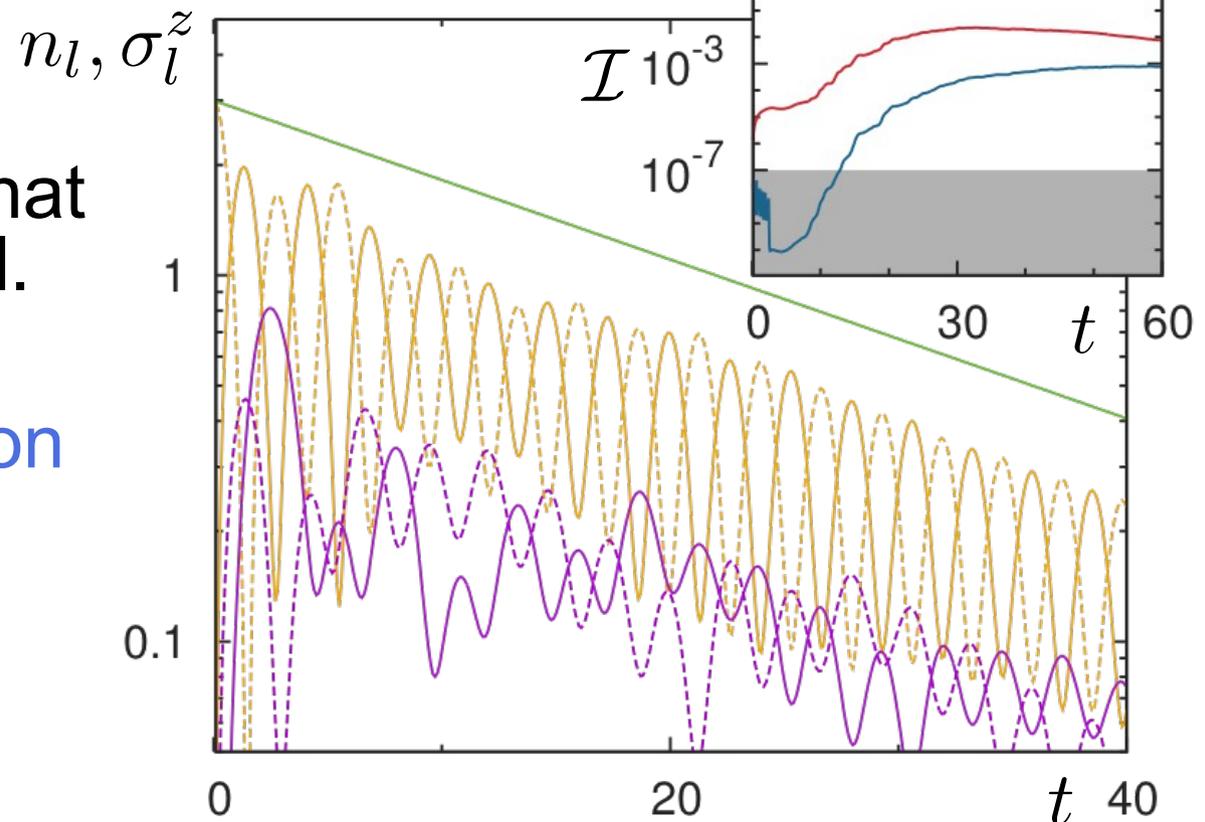
## B.1) “Photonic Josephson Junction”:

System: two spins-1/2, each within an optical cavity.

$$H = \sum_{l=1,2} (\alpha_l (\sigma_l^+ c_l + \sigma_l^- c_l^\dagger) + \omega_C n_l + \omega_S \sigma_l^z) + \eta (c_1^\dagger c_2 + c_2^\dagger c_1)$$

Dissipation: spontaneous loss  $L_{S_l} = \sqrt{\gamma} \sigma_l^-$ ,  $L_{C_l} = \sqrt{\gamma} c_l$

Study transient dynamics and compare to exact results



## B.2) Fermionic quantum wire:

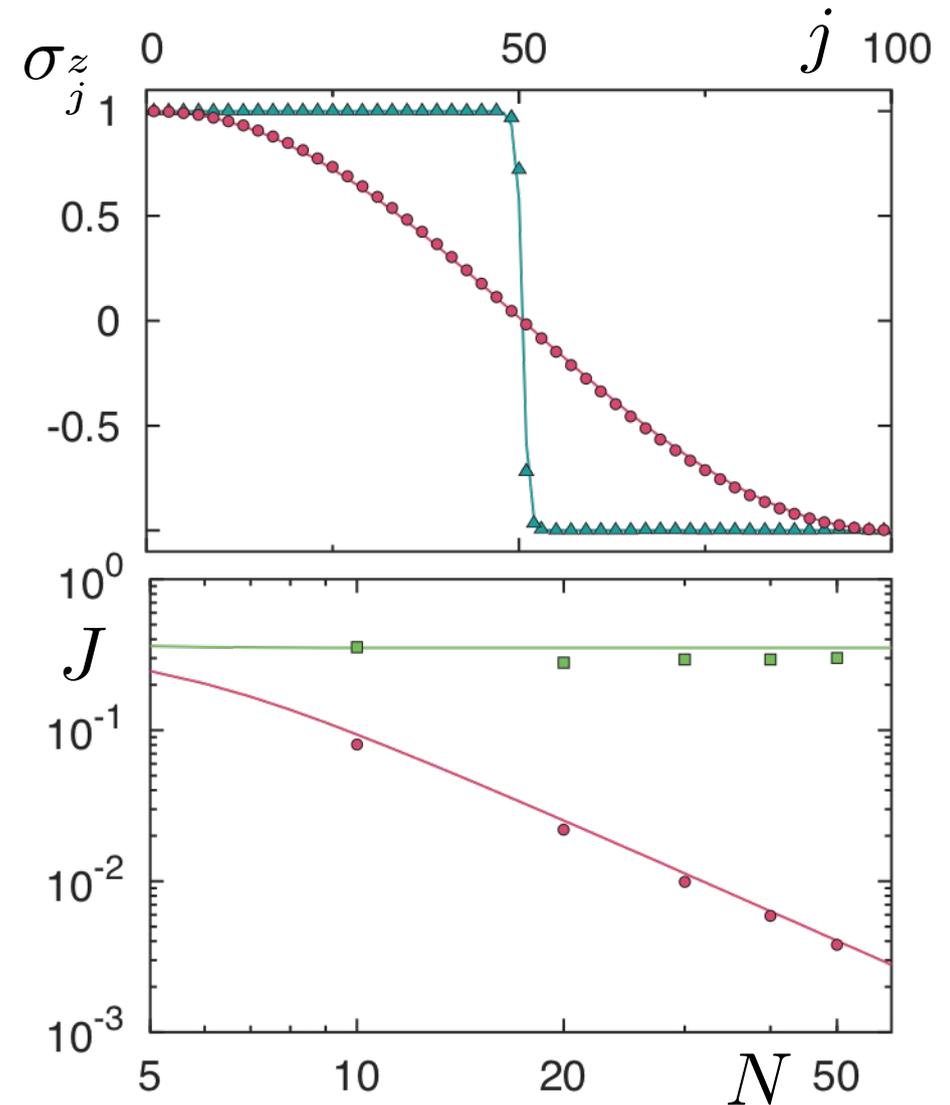
Spin-1/2 XXZ model  
(equivalent to Hubbard  
with density-density int.)

$$H = \sum_j (\sigma_j^x \sigma_{j+1}^x + \sigma_j^y \sigma_{j+1}^y + \Delta \sigma_j^z \sigma_{j+1}^z)$$

Dissipation: particle-source  
at left edge, particle-drain  
at right edge

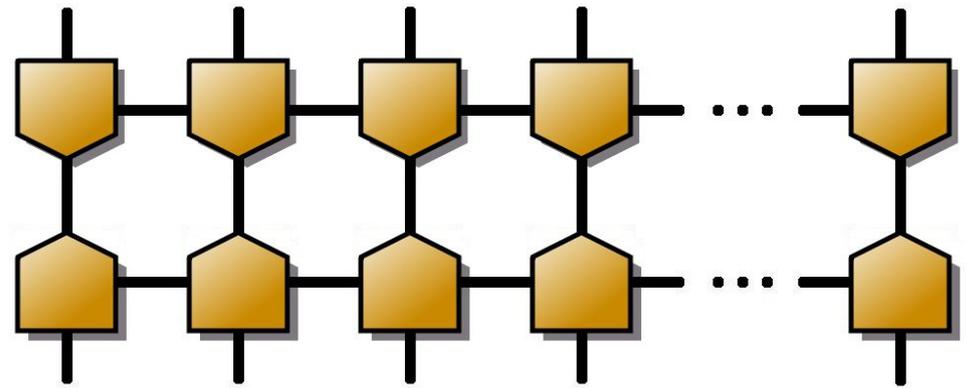
$$L_s = \sqrt{\gamma} \sigma_1^+, \quad L_d = \sqrt{\gamma} \sigma_N^-$$

We study steady dynamics and measure population and particle current  $J = 2 \operatorname{Im} \langle \sigma_j^+ \sigma_{j+1}^- \rangle$ . We compare results with analytical predictions<sup>8</sup>.



8) T. Prozen; Phys. Rev. Lett. **107**, 137201 (2011)

# Conclusions



We designed an algorithm based on Locally Purified Tensor Network states, which:

- Simulates open-system Markovian dynamics, which can capture both transient and steady behavior.
- Also simulates finite temperature states
- Guarantees positivity of the variational ansatz at all times, overcoming previous limitations.

# Methods Comparison

Quantum Jumps



Excellent transient dynamics



Challenging for highly mixed states

MPDO



Excellent for steady states



Can not determine positivity

LPTN



Positive, efficient, and accurate in both regimes.



Slightly more expensive