

THE ROUGH GUIDE to

Quantum many-body systems

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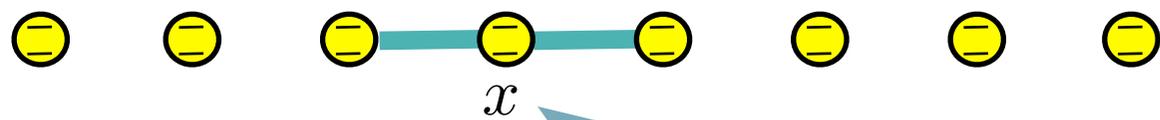
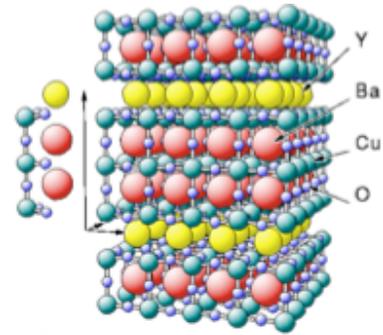
Mention joint work with
M. Cramer, C. Dawson, T.J. Osborne, M.B. Plenio, F. Verstraete
+ lots of tutorial material

See also Frank's talk just afterwards



• Introduction

• Quantum many-body systems on a lattice:



Hilbert space: $\mathcal{H} = \bigotimes_{x \in L} \mathcal{H}_x$

Quantum degree of freedom per lattice site

Hamiltonian: $\hat{H} = \sum_{x \in L} (\hat{h}_x + \hat{k}_x)$

Spin degree of freedom: \mathbb{C}^2 or bosonic/fermionic/...

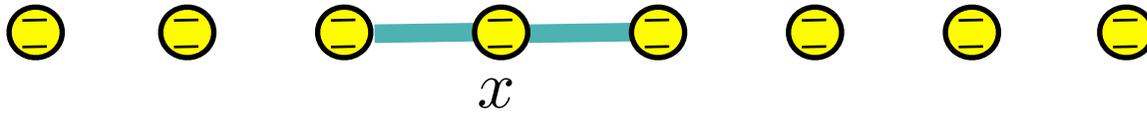
On-site interaction

Finite-ranged interaction to neighbors

Metric: $d(., .)$

• Introduction

• Quantum many-body systems on a lattice:



Spin chains: XY model,
Heisenberg model

$$\hat{H}_{XY} = - \sum_{\alpha \in \mathbb{Z}} \left[\frac{1 + \gamma}{2} \hat{\sigma}_{\alpha}^x \hat{\sigma}_{\alpha+1}^x + \frac{1 - \gamma}{2} \hat{\sigma}_{\alpha}^y \hat{\sigma}_{\alpha+1}^y + \lambda \hat{\sigma}_{\alpha}^z \right]$$

Bose/Fermi-Hubbard-
type models

$$\hat{H} = -J \sum_{\alpha \in \mathbb{Z}} \left[\hat{a}_{\alpha+1}^{\dagger} \hat{a}_{\alpha} + \hat{a}_{\alpha}^{\dagger} \hat{a}_{\alpha+1} \right] + U \sum_{\alpha \in \mathbb{Z}} \hat{n}_{\alpha} (\hat{n}_{\alpha} - 1) - \mu \sum_{\alpha \in \mathbb{Z}} \hat{n}_{\alpha}$$

Quasi-free bosonic or
fermionic systems

$$\hat{H} = \frac{1}{2} \left[\sum_{\alpha \in \mathbb{Z}} \hat{p}_{\alpha}^2 + \sum_{\alpha, \beta \in \mathbb{Z}} \hat{x}_{\alpha} V \hat{x}_{\beta} \right]$$

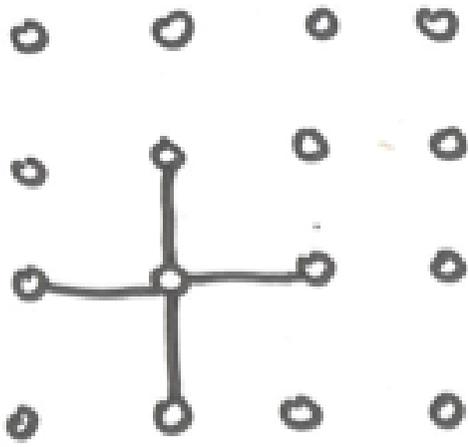
- **Introduction**

- **Quantum many-body systems on a lattice:**



• Introduction

• Outline of the talk:

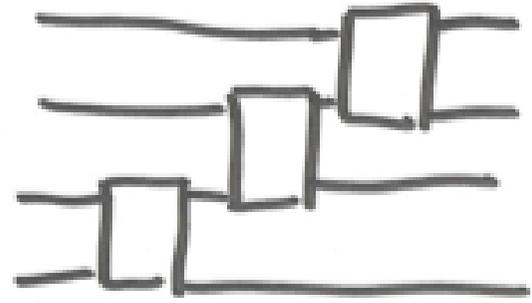
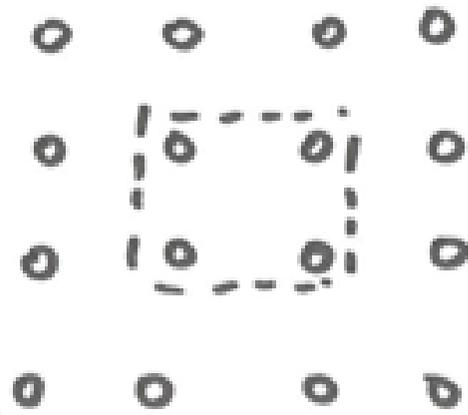


1. Locality in quantum many-body systems



3. Matrix-product states and unitary networks

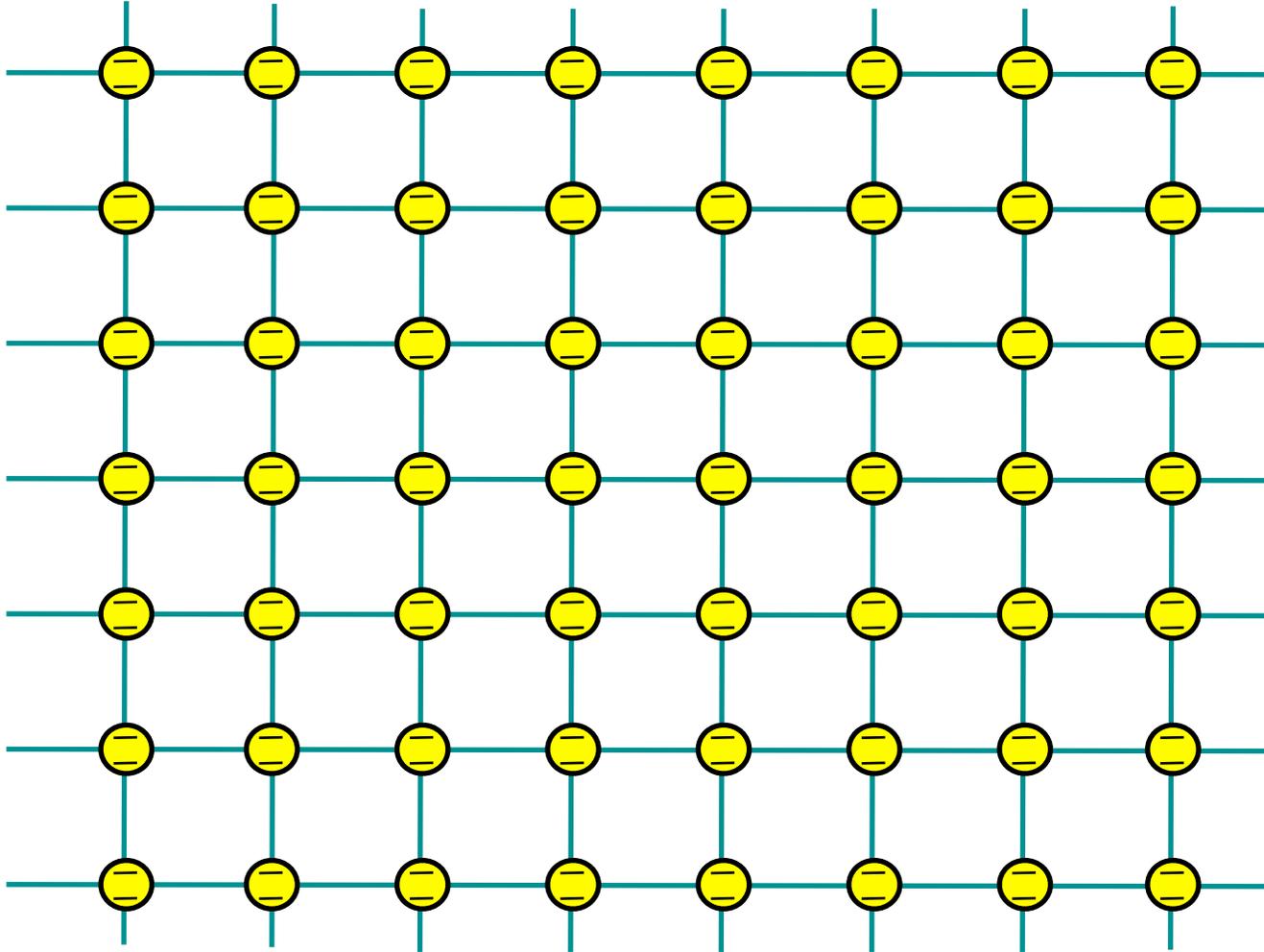
2. Area laws



4. Flow

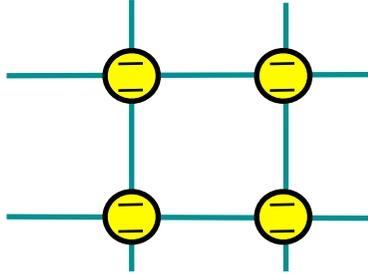
• Locality in quantum many-body systems

- Simple to **describe** (Hamiltonian), typically difficult to **find** (ground/Gibbs state) **properties**



• Locality in quantum many-body systems

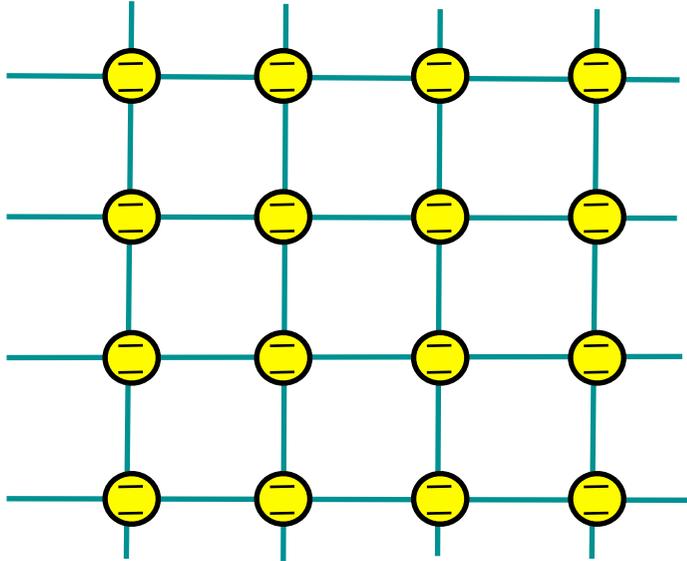
- Simple to **describe** (Hamiltonian), typically difficult to **find** (ground/Gibbs state) **properties**



- Hilbert space dimension for spin model: 16

• Locality in quantum many-body systems

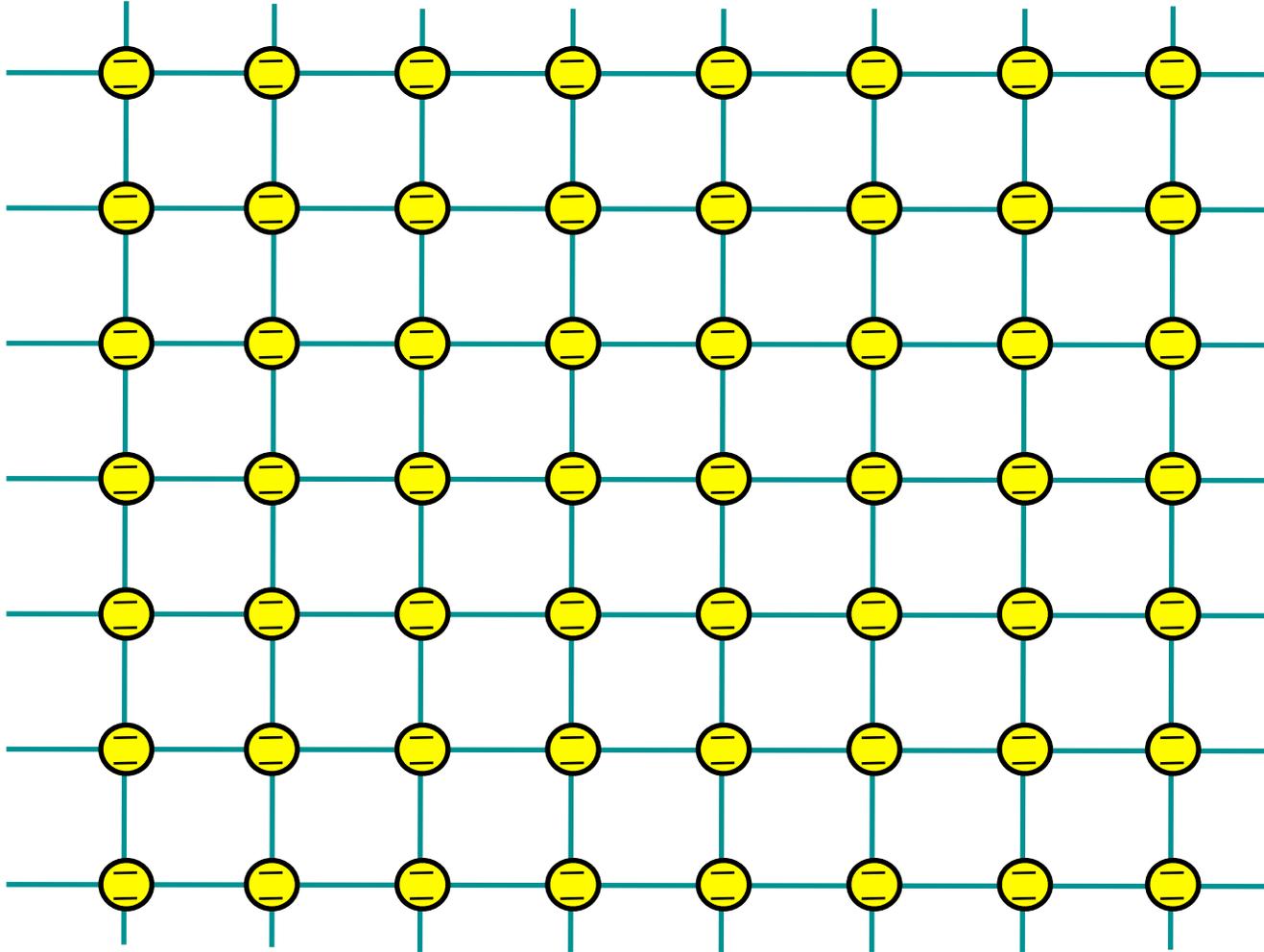
- Simple to **describe** (Hamiltonian), typically difficult to **find** (ground/Gibbs state) **properties**



- Hilbert space dimension for spin model: 65.536

• Locality in quantum many-body systems

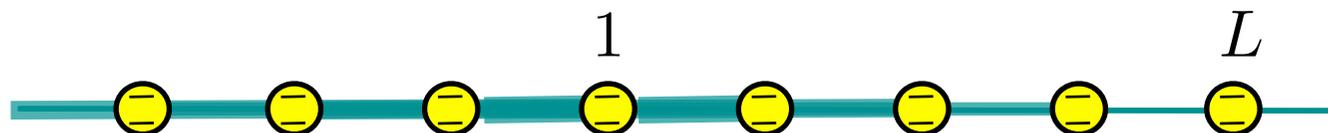
- Simple to **describe** (Hamiltonian), typically difficult to **find** (ground/Gibbs state) **properties**



- Hilbert space dimension for spin model: 72.057.594.037.927.936

• Locality in quantum many-body systems

- **Insight:** to faithfully describe ground states of local Hamiltonians, no need to consider exponentially large Hilbert space



- Finite interaction length,

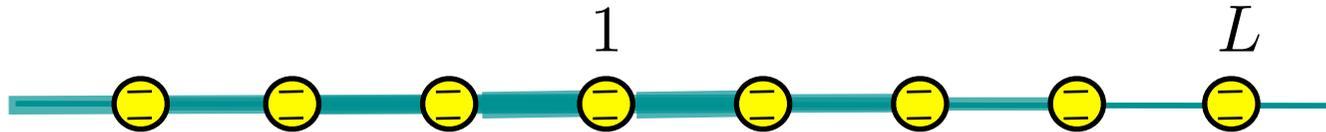
- exponentially decaying correlations (non-critical), or $\xi^{-1} = \lim_{L \rightarrow \infty} \frac{1}{L} \log C_{1,L}$
- algebraically decaying **correlation functions**

$$C_{a,L} = \langle \hat{o}_1 \hat{o}_L \rangle - \langle \hat{o}_1 \rangle \langle \hat{o}_L \rangle$$

- Systems with spectral gap $\Delta E > 0$ are non-critical (from *Lieb-Robinson bounds*)

• Locality in quantum many-body systems

- **Insight:** to faithfully describe ground states of local Hamiltonians, no need to consider exponentially large Hilbert space

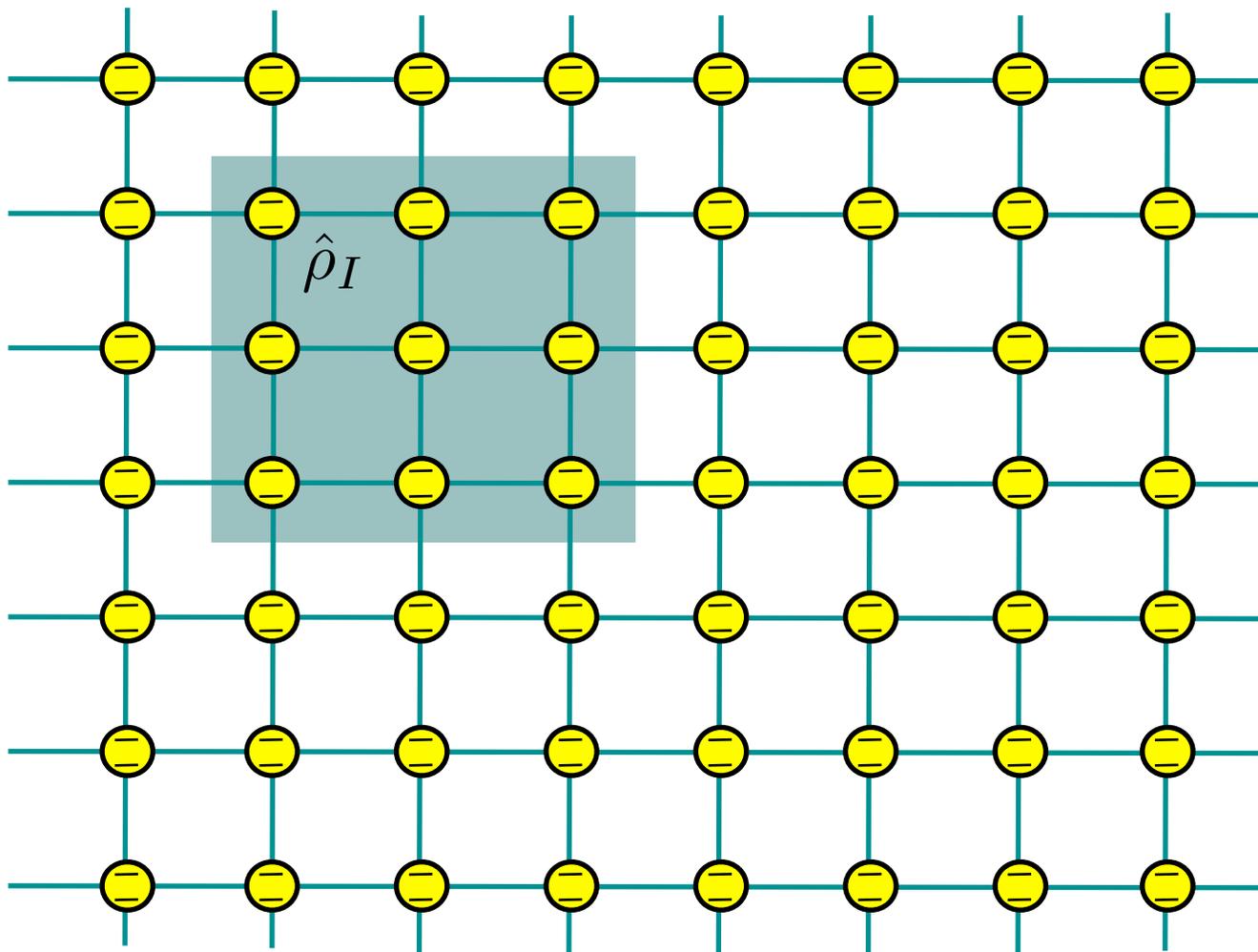


- Is this locality inherited by **quantum correlations + entanglement**?
- What does this mean for **classical simulatability**?

2. Area laws

- **Area laws**

- **Scaling** of geometric entropy/**entanglement entropy**?



$$S(\hat{\rho}_I) = -\text{tr}[\hat{\rho}_I \log \hat{\rho}_I]$$

• Area laws

• “History of the problem”

- *Black hole context*: Geometric entropy satisfies area law?

Bombelli, Koul, Lee, Sorkin (1986)
Srednicki (1993)
Holzhey, Larsen, Wilczek (1994)

• Quantum information interest:

- Relationship between **entanglement scaling and criticality**

- **Locality** of interactions inherited by entanglement?

Audenaert, Eisert, Plenio, Werner (2002)
Vidal, Latorre, Kitaev, Rico (2003)
Its, Jin, Korepin (2005)
Calabrese, Cardy (2004)

- Question of **simulatability** (effective degrees of freedom)

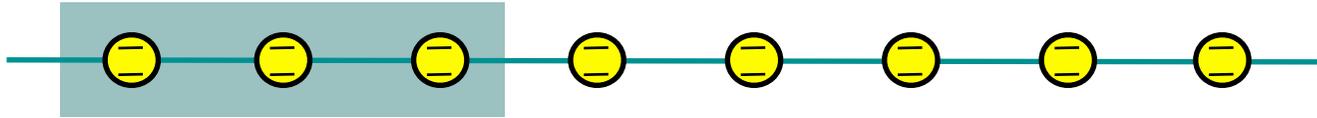
Verstraete, Cirac (2006)
Peres-Garcia, Verstraete, Wolf, Cirac (2006)

- Let's have look at problem where the **higher-dim case** can be tackled

Plenio, Eisert, Dreissig, Cramer (2005)
Cramer, Eisert (2006)

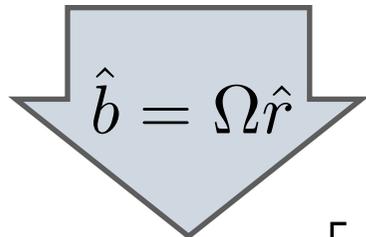
- Area laws

- Here: **Bosonic and fermionic systems on a lattice, $D > 1$**



$$\hat{H} = \sum_{j,k \in L} \left(\hat{a}_j^\dagger A_{j,k} \hat{a}_k + \hat{a}_j A'_{j,k} \hat{a}_k^\dagger + \hat{a}_j B_{j,k} \hat{a}_k + \hat{a}_j^\dagger B'_{j,k} \hat{a}_k^\dagger \right)$$

$$= \hat{a}^T \begin{bmatrix} B & A' \\ A & B' \end{bmatrix} \hat{a}, \quad \hat{a} = (\hat{a}_1, \dots, \hat{a}_{|L|}, \hat{a}_1^\dagger, \dots, \hat{a}_{|L|}^\dagger)^T$$



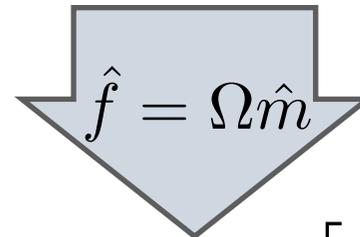
$$\hat{b} = \Omega \hat{r}$$

“Canonical coordinates”

$$\hat{H} = \hat{r}^T \begin{bmatrix} A + B & 0 \\ 0 & A - B \end{bmatrix} \hat{r}$$

$$(i[\hat{r}_j, \hat{r}_k]) = \begin{bmatrix} 0 & -\mathbb{1} \\ \mathbb{1} & 0 \end{bmatrix}$$

- Bosons



$$\hat{f} = \Omega \hat{m}$$

“Majorana fermions”

$$\hat{H} = i\hat{m}^T \begin{bmatrix} 0 & A + B \\ B - A & 0 \end{bmatrix} \hat{m}$$

$$\{\hat{m}_j, \hat{m}_k\} = \delta_{j,k}$$

- Fermions

• **Technical difficulty:** Problem no longer has symmetry of Hamiltonian

• Area laws

• **Idea I:** Bound to entropy from correlation functions

$$S(\hat{\rho}_I) \leq 4\lambda_{\max}((A - B)^{-1}) \times \sum_{j \in I, k \in O} |((A + B)^{-1})_{j,k}|$$

$$S(\hat{\rho}_I) \leq 2 \sum_{j \in I, k \in O} |\langle \hat{f}_j^\dagger \hat{f}_k \rangle + \langle \hat{f}_j \hat{f}_k \rangle|$$

- Ideas: Bound via logarithmic negativity, use l_1 norm

- ... or use quadratic bounds

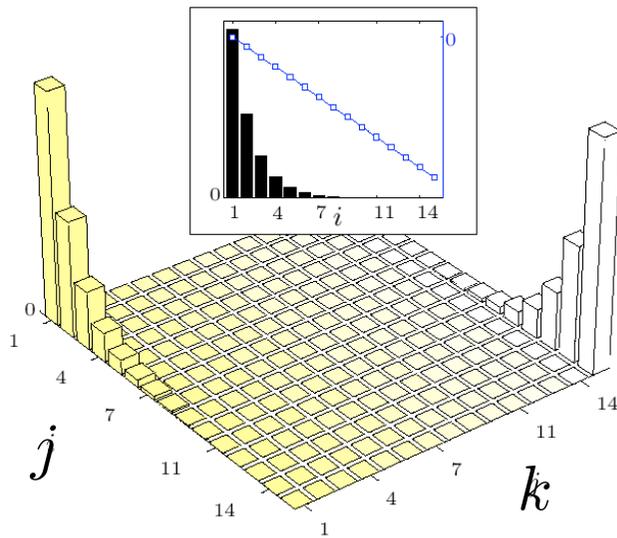
• Bosons

• Fermions

- Area laws

- **Idea 2:** Exponential decay in matrix functions:

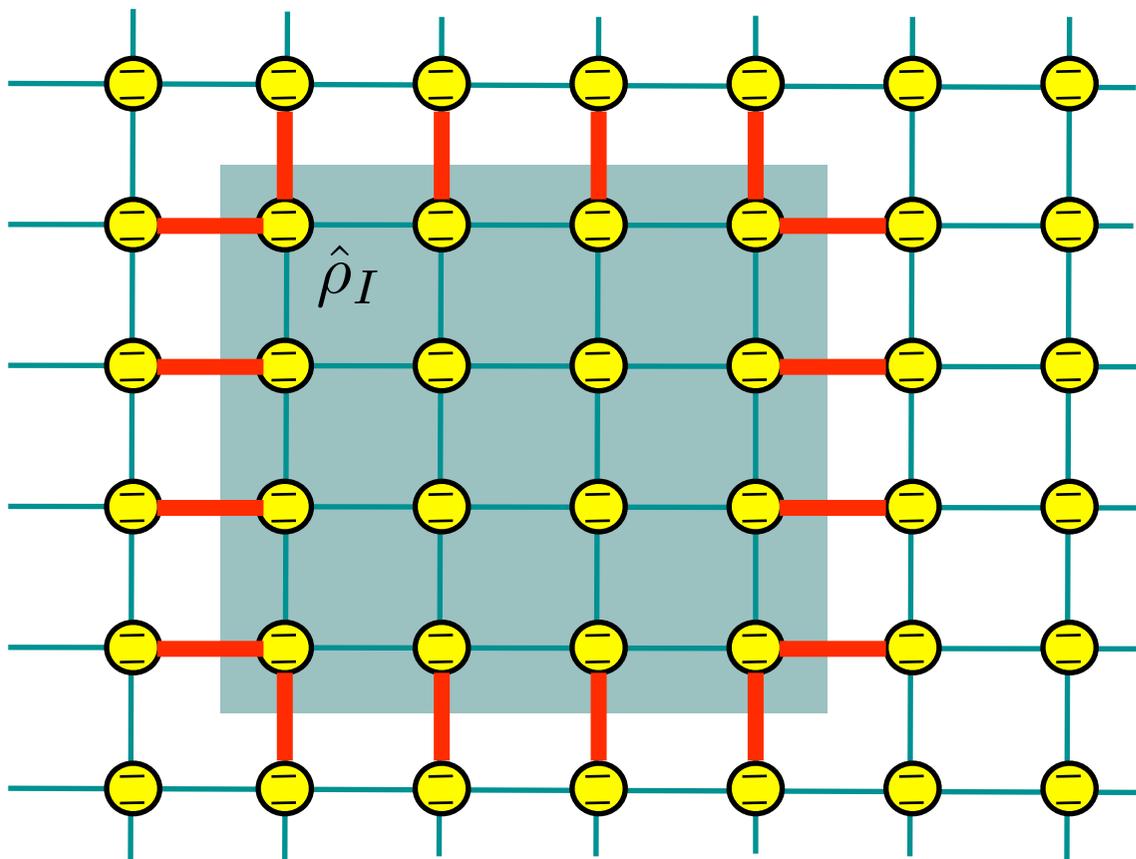
$$|[f(M)]_{j,k}| \leq K e^{-d(j,k)/\xi}$$



- Bosons

- Area laws

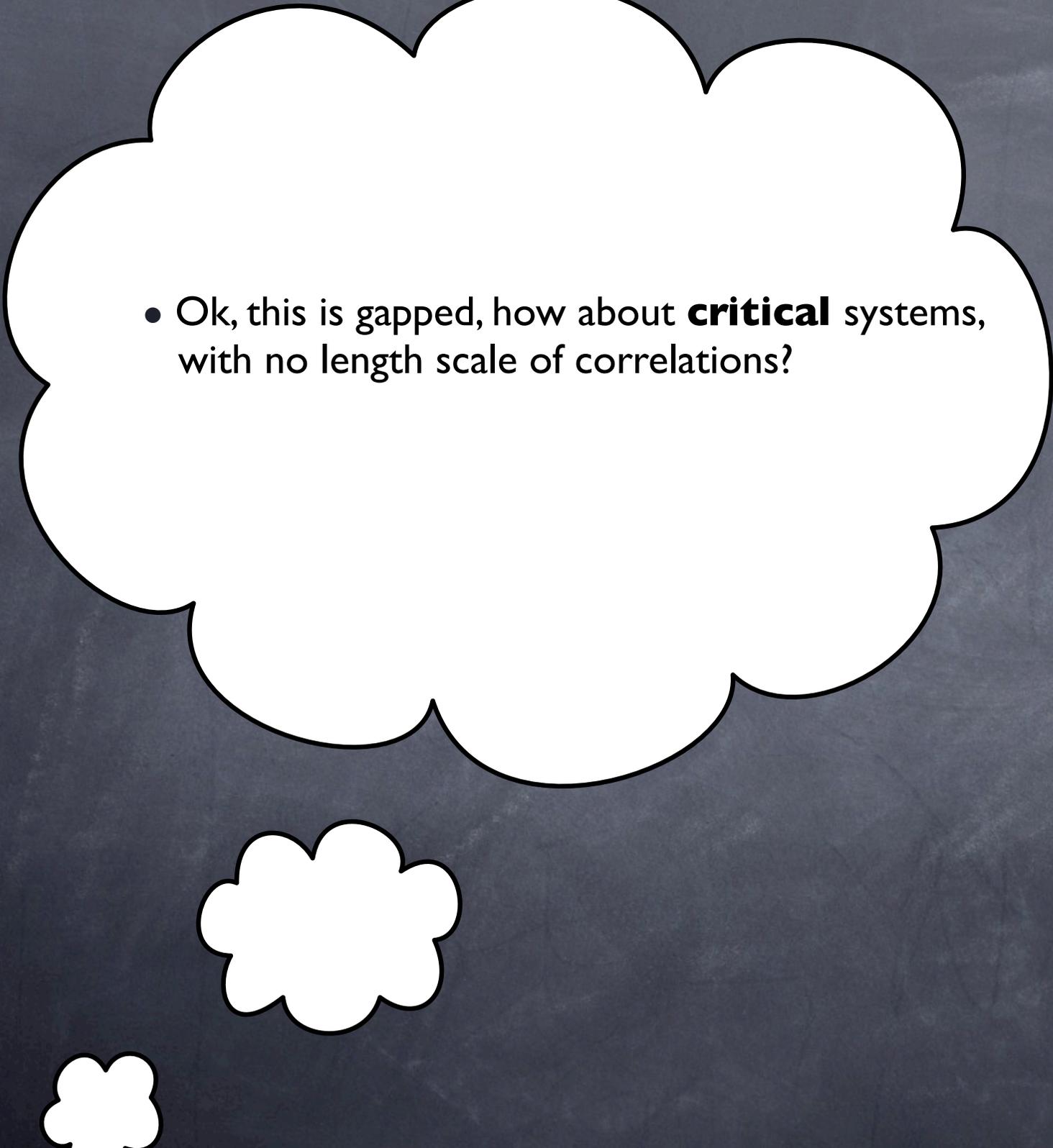
- And ... it does give an area law



- Gapped quasi-free, local bosonic systems:

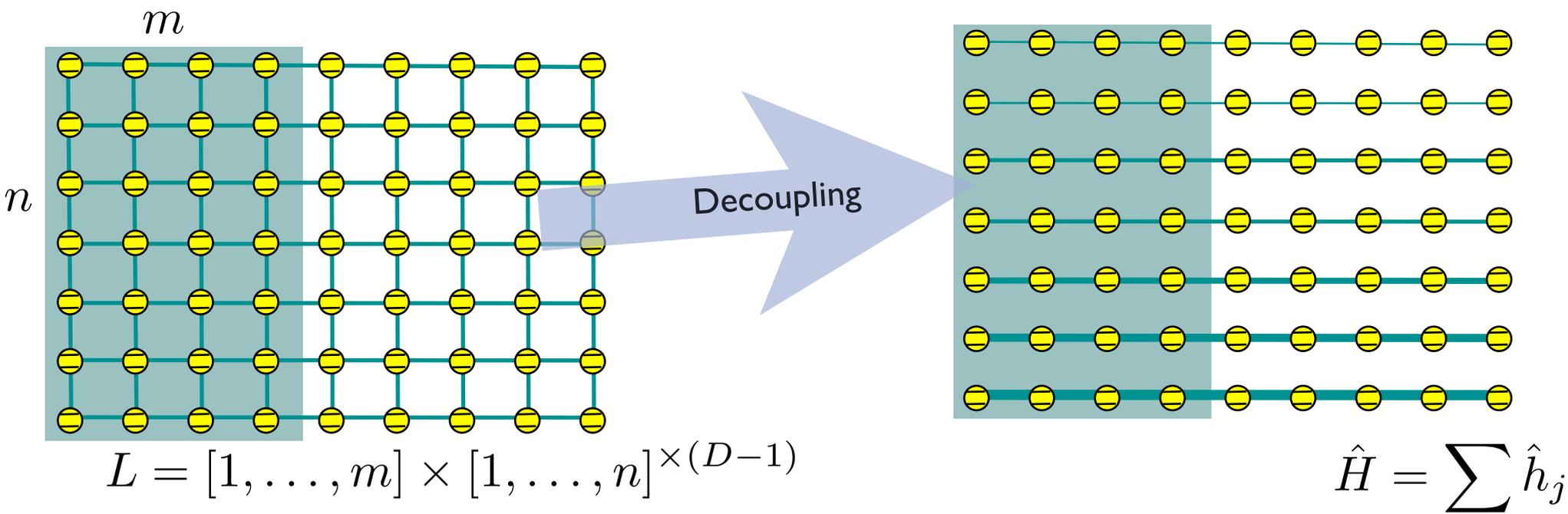
$$S(\hat{\rho}_I) \leq K s(I)$$

- Bosons

- 
- Ok, this is gapped, how about **critical** systems, with no length scale of correlations?

- **Area laws**

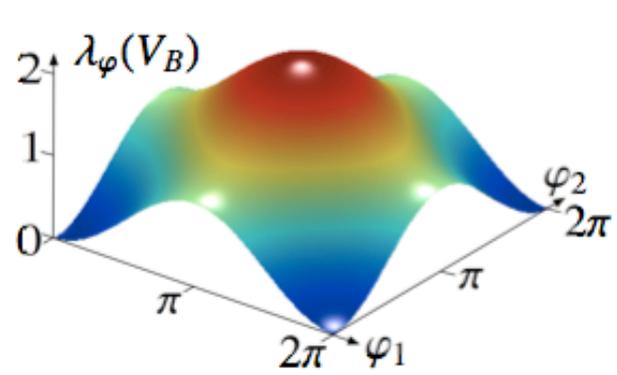
- Critical bosons and fermions in half spaces:



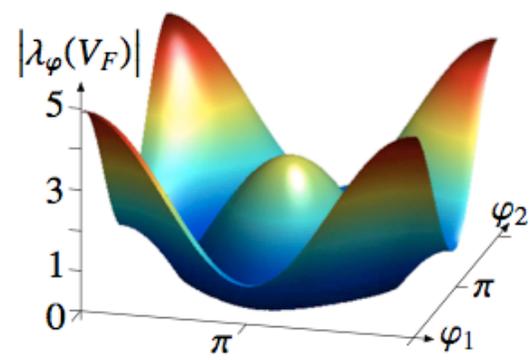
- **Ideas:** Upper bound from negativity for half-chains, using flip symmetry

- **Ideas:** Bounds using Fisher-Hartwig methods for Toeplitz determinants

- **Bosons**



- **Fermions**



- **Area laws**

- **Critical bosons and fermions in half spaces:**



$$S(\hat{\rho}_I) = O(n^{D-1} \log n)$$

$$S(\hat{\rho}_I) = O(n^{D-1})$$

- **Violation** of area law
- here with *known prefactor*, dependent on topology of Fermi surface

• Can hence depend on statistics whether area law is violated or not

- **Bosons**

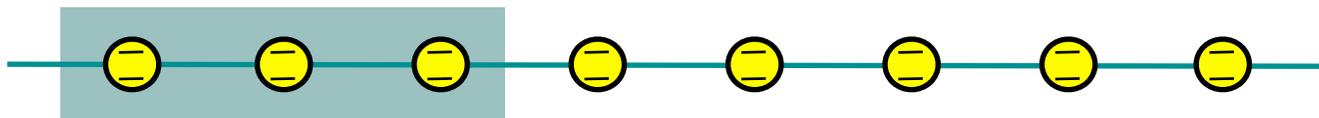
Cramer, Eisert, Plenio (2006)

- **Fermions**

Wolf (2006)
Gioev, Klich (2006)
Cramer, Eisert, Plenio (2006)

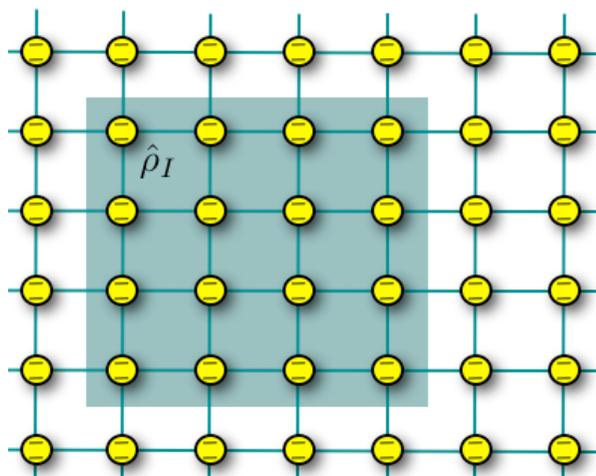
• Area laws

- **ID:** In the meantime: Full proof of area laws for local gapped models



Hastings (2007)

- $> ID$: For the **quantum mutual information** as correlation measure for *thermal states*: Area law for general local interactions



$$I(I : O) = S(\rho_I) + S(\rho_O) - S(\rho)$$

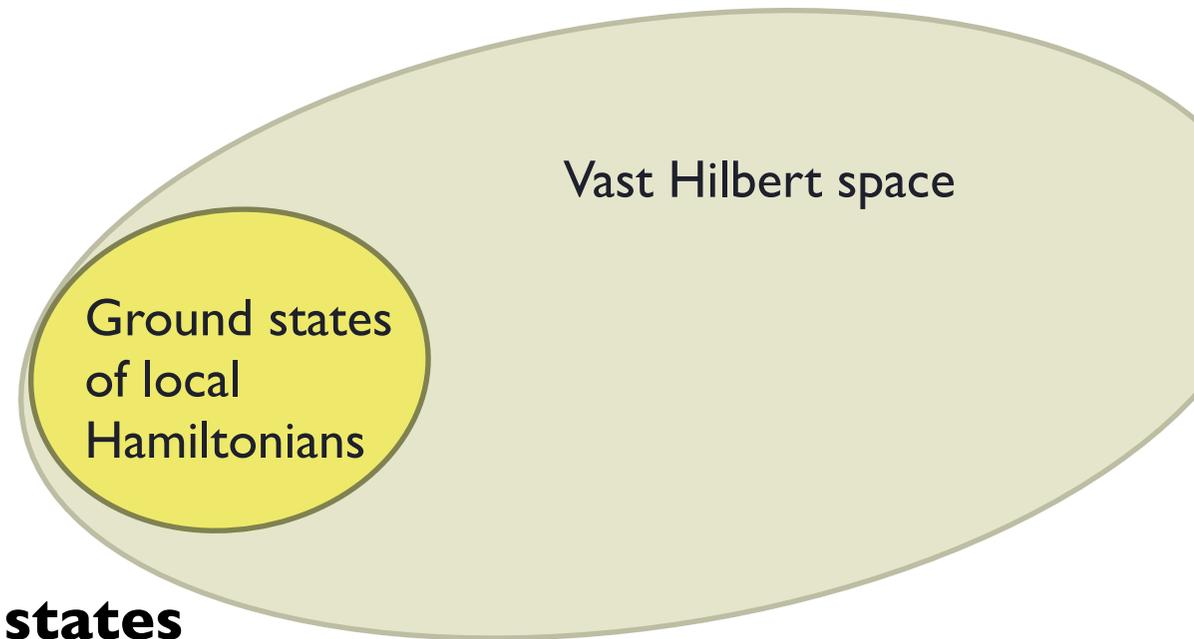
Wolf, Verstraete, Hastings, Cirac (2007)

- Lesson: There is **much less** entanglement typically than could be (volume)!

3. Matrix-product states, MERA, and the zoo of unitary networks

• Matrix-product states, MERA, and the zoo of unitary networks

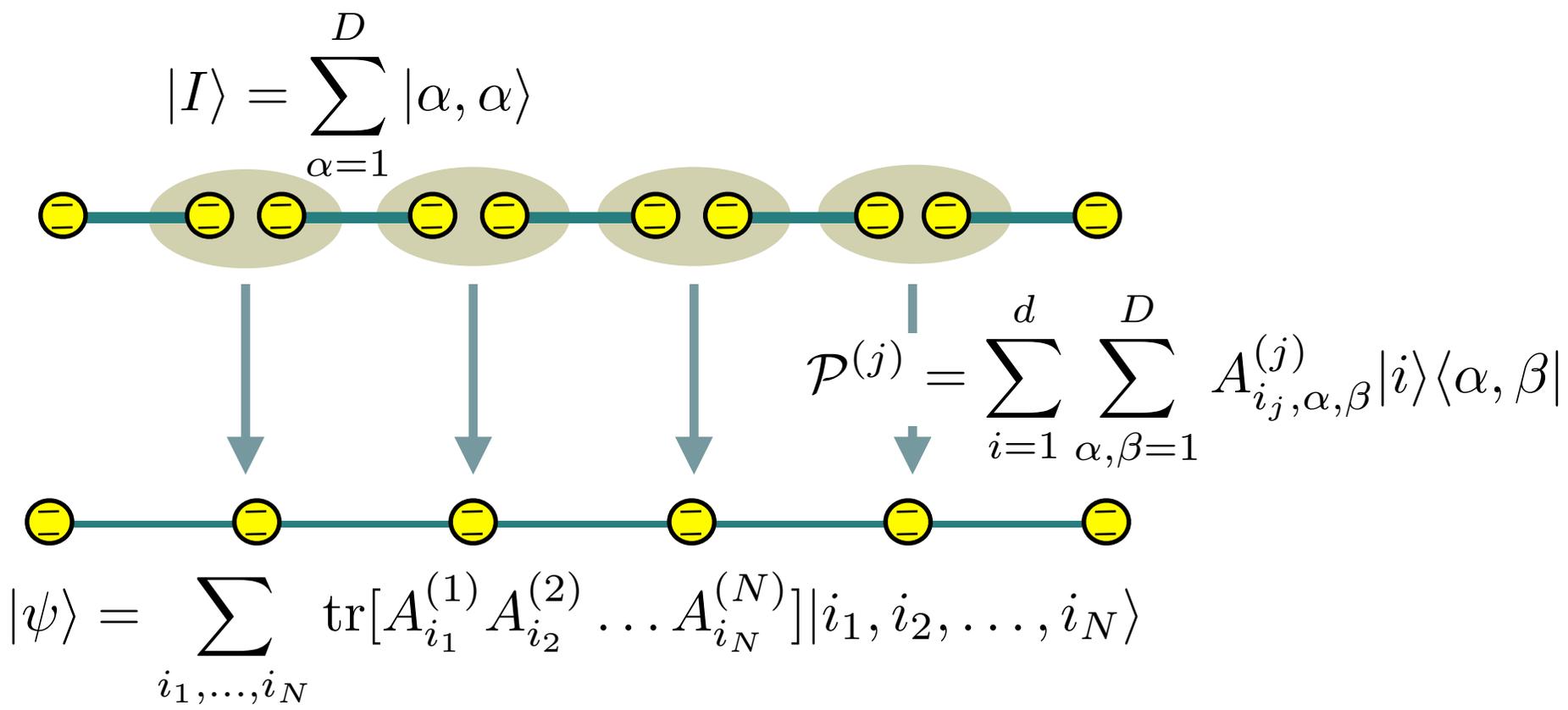
- **Insight, again:** To faithfully describe ground states of local Hamiltonians, one does not need to consider exponentially large Hilbert space
- Look at much smaller (poly-sized) **subspaces** that grasp ground state properties
- Such that one can **efficiently compute** $\langle \psi | \hat{A} | \psi \rangle$ for local (supp on finite number of sites) observables \hat{A}



- Will have look at such **classes of states**

• **Matrix-product states, MERA, and the zoo of unitary networks**

- Valence bond picture of **matrix product states**:



• Matrix-product states, MERA, and the zoo of unitary networks

• Matrix product states (MPS):

- Characterized by matrices $\{A_1^{(j)}, \dots, A_d^{(j)}\}$ per site
- DMRG - *workhorse of simulation in 1D* - is essentially variation over MPS better and better approximating the true ground state
- DMRG works well in practice

• **Area law** (for Renyi entropies) satisfied: ex. efficient MPS approximation of ground state

Peschel (2001)

Schuch, Wolf, Verstraete, Cirac (2007)

(Strictly speaking not certifiable: Variations over MPS can be NP-hard
Eisert (2006)
Gapped models with MPS as ground states; to find it is NP-hard

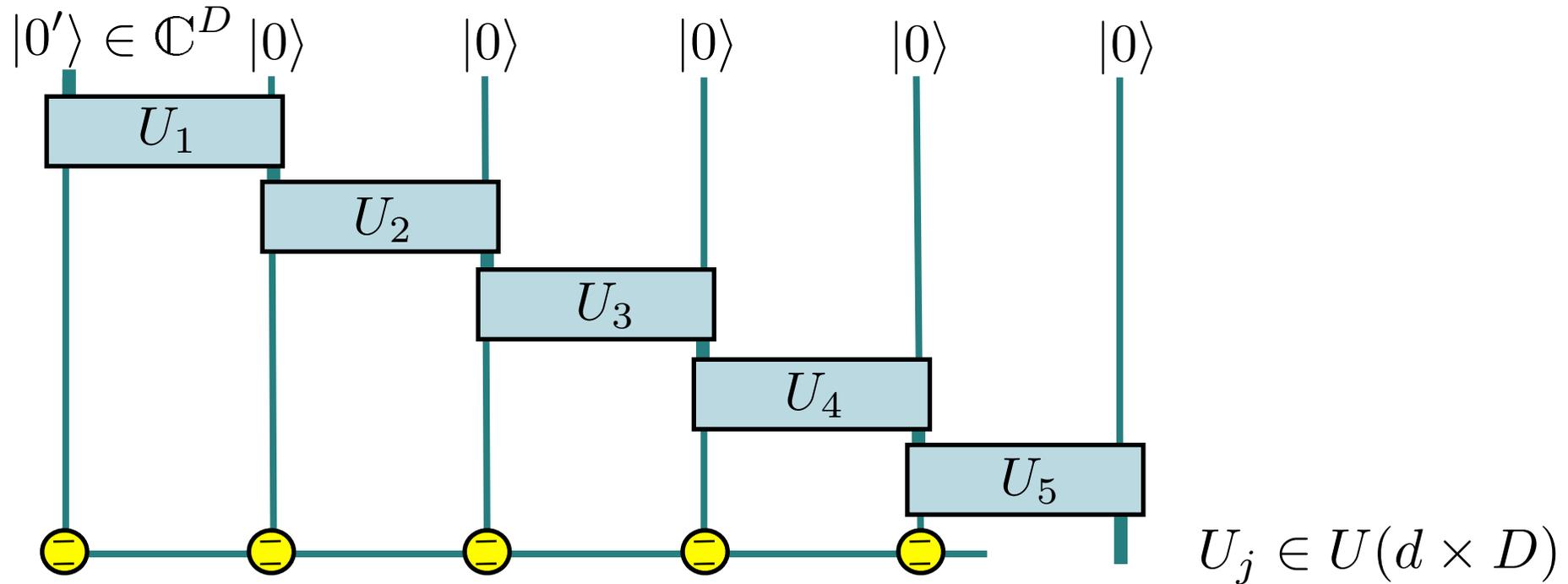
Schuch, Cirac, Verstraete, in preparation



$$|\psi\rangle = \sum_{i_1, \dots, i_N} \text{tr}[A_{i_1}^{(1)} A_{i_2}^{(2)} \dots A_{i_N}^{(N)}] |i_1, i_2, \dots, i_N\rangle$$

• Matrix-product states, MERA, and the zoo of unitary networks

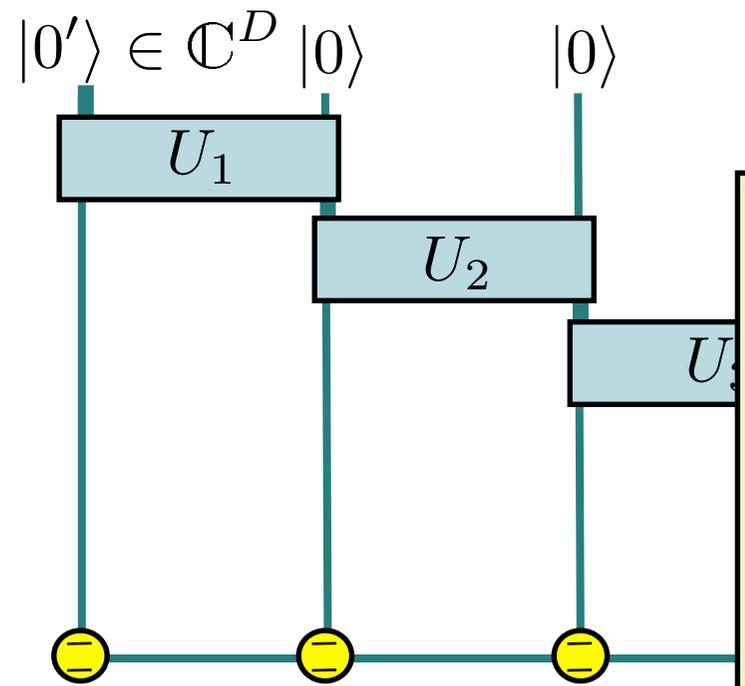
• Unitary network preparation of MPS: **Staircase circuit**



Fannes, Naechtergaele, Werner (1992)
Schoen, Hammerer, Wolf, Cirac, Solano (2006)
Schoen, Solano, Verstraete, Cirac, Wolf (2005)
Dawson, Eisert, Osborne (2007)

• **Matrix-product states, MERA, and the zoo of unitary networks**

• Unitary network preparation of MPS: **Staircase circuit**



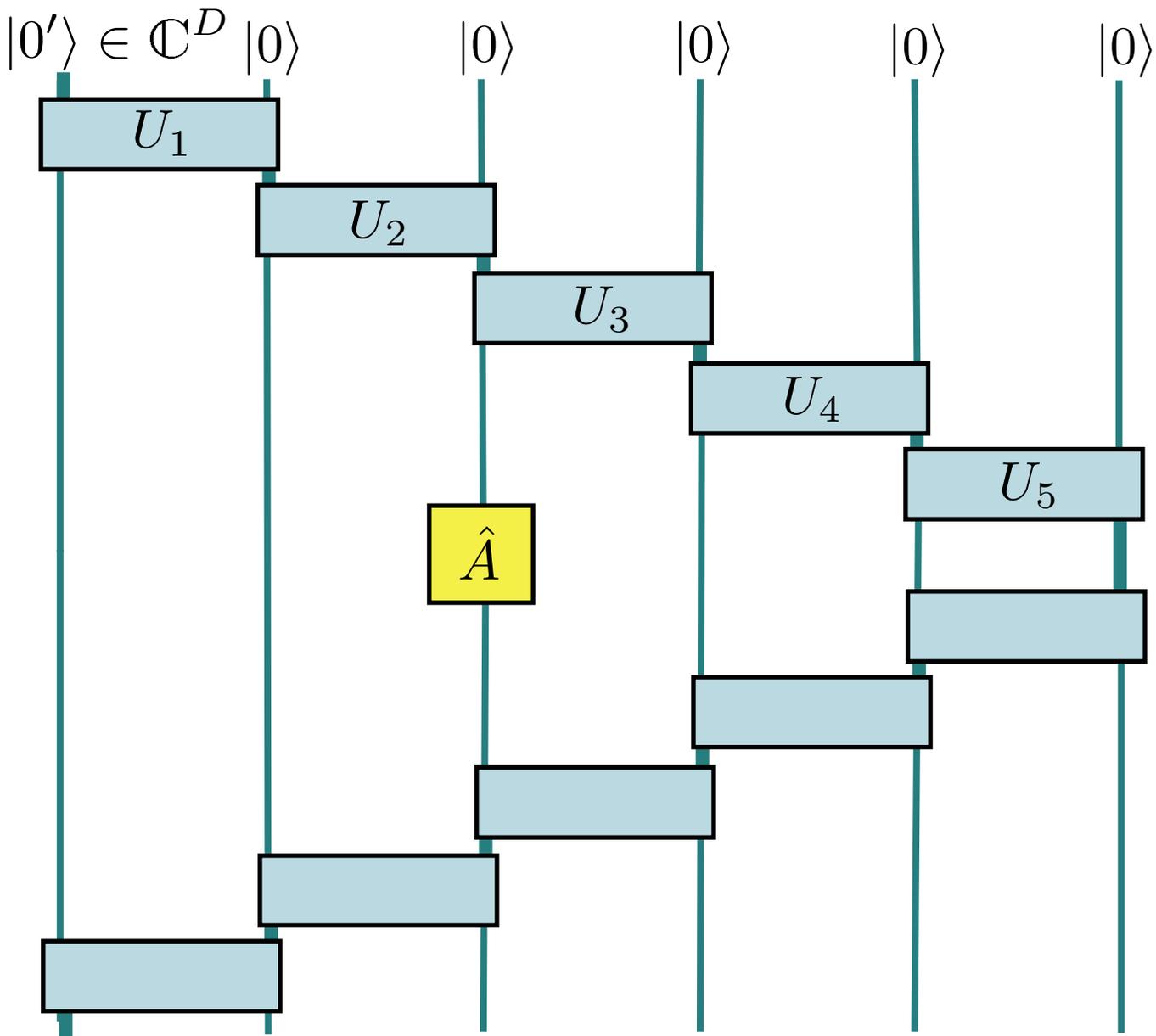
• **Cavity-QED implementation:**

• Trapped D -level atom coupled to time-bin qubits of optical cavity field mode

Schoen, Hammerer, Wolf, Cirac, Solano (2006)
 Schoen, Solano, Verstraete, Cirac, Wolf (2005)

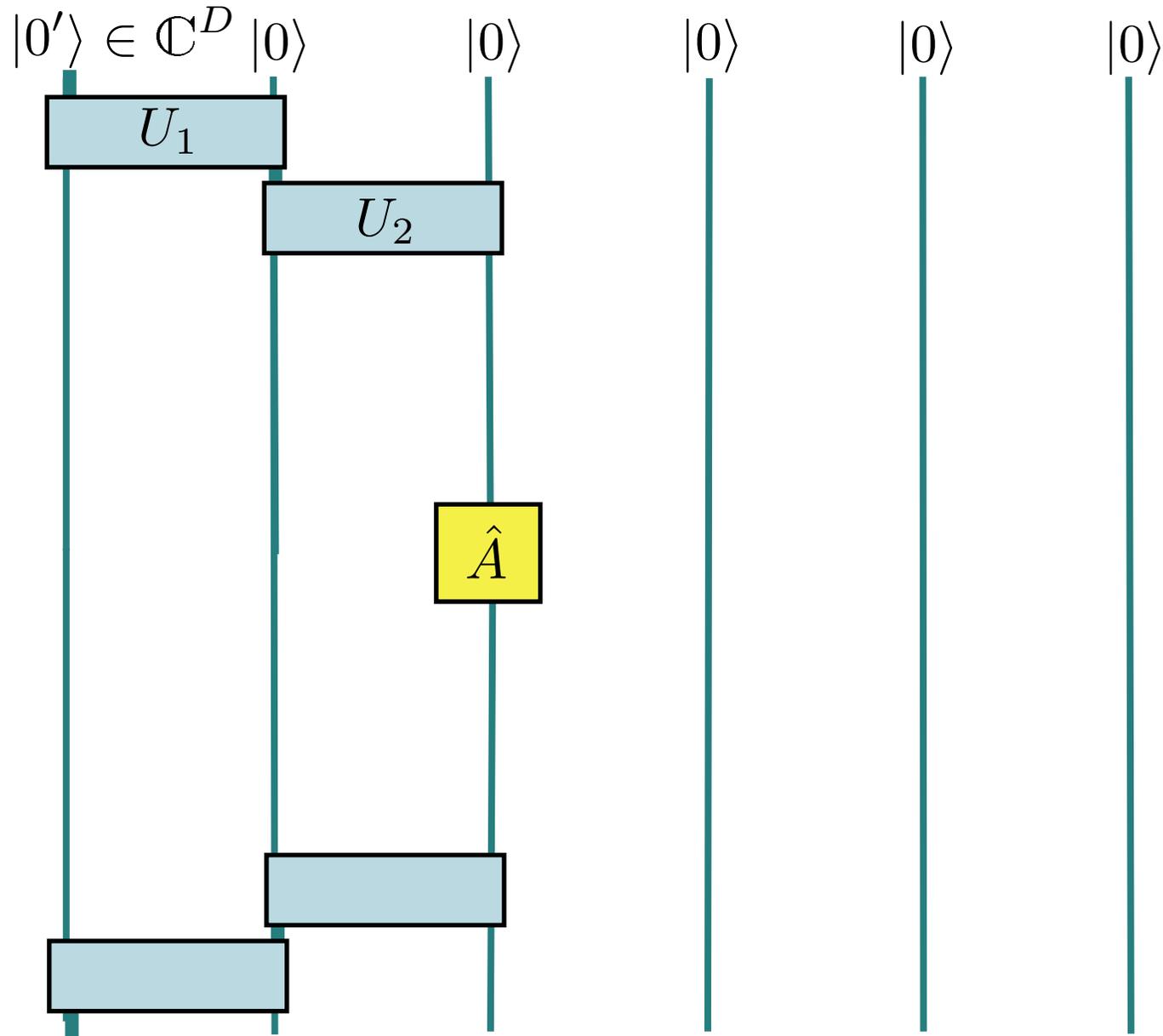
Matrix-product states, MERA, and the zoo of unitary networks

- Contraction: Compute $\langle \psi | A | \psi \rangle$, in a way that we will use later



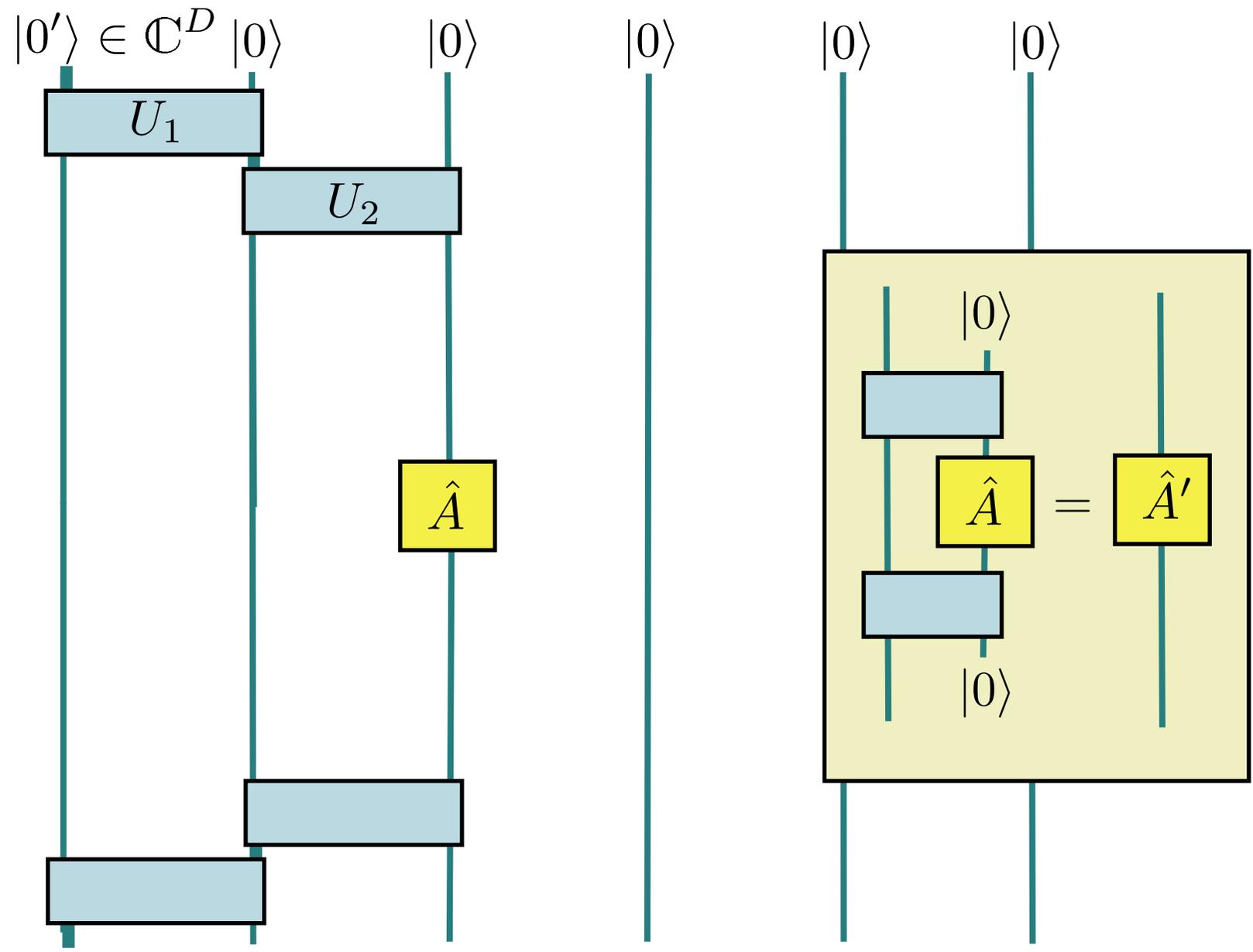
• Matrix-product states, MERA, and the zoo of unitary networks

- Contraction: Compute $\langle \psi | A | \psi \rangle$, in a way that we will use later



Matrix-product states, MERA, and the zoo of unitary networks

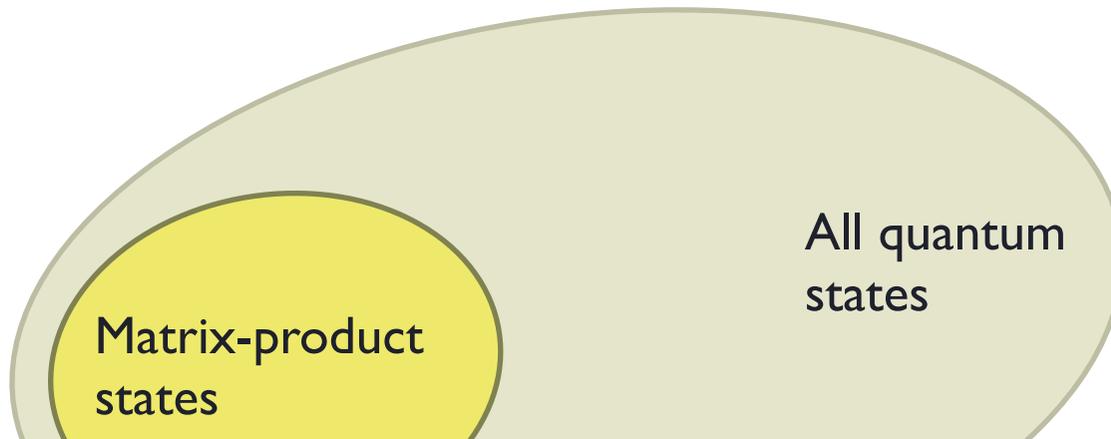
- Contraction: Efficiently computable!



• Matrix-product states, MERA, and the zoo of unitary networks

- Interestingly, more generally: **MPS + “weighted graphs”**

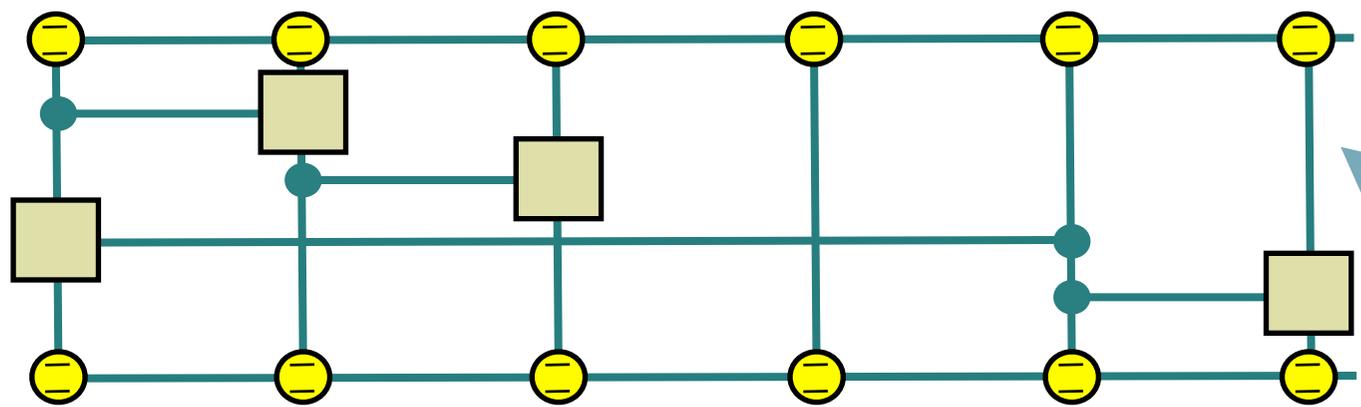
$$|\psi\rangle = \sum_{i_1, \dots, i_N} \text{tr}[A_{i_1}^{(1)} A_{i_2}^{(2)} \dots A_{i_N}^{(N)}] |i_1, i_2, \dots, i_N\rangle$$



Matrix-product states, MERA, and the zoo of unitary networks

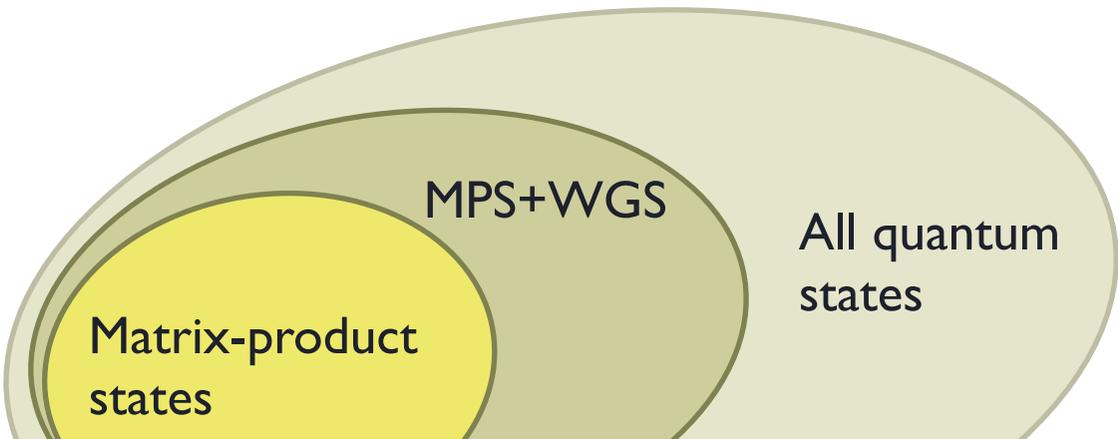
- Interestingly, more generally: **MPS + “weighted graphs”**

$$|\psi\rangle = \prod_k U_k \sum_{i_1, \dots, i_N} \text{tr}[A_{i_1}^{(1)} A_{i_2}^{(2)} \dots A_{i_N}^{(N)}] |i_1, i_2, \dots, i_N\rangle$$



Arbitrary phase gates between arbitrary constituents

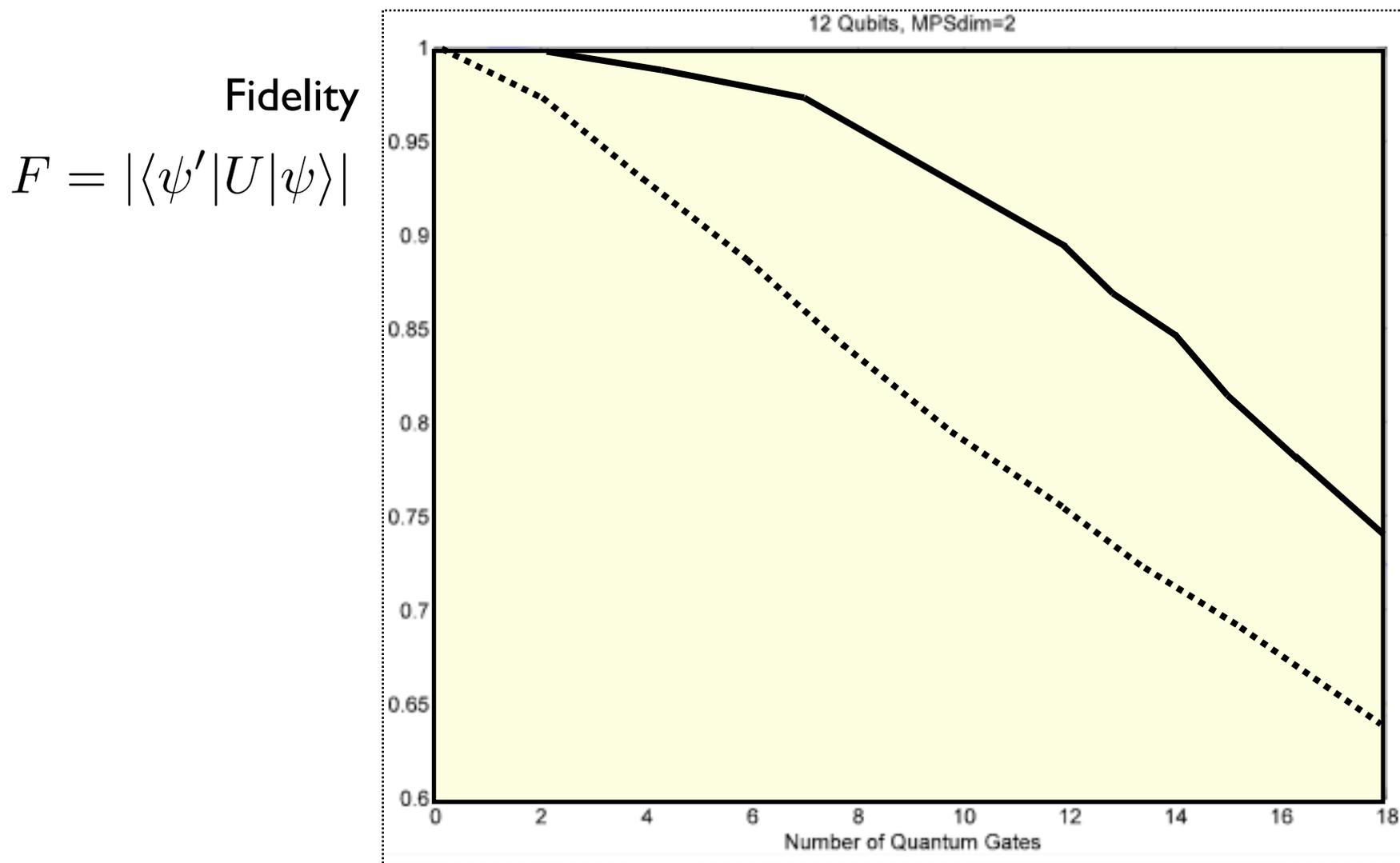
- Can **still contract** and compute local expectation values



Eisert, Plenio, Verstraete, in prep
Anders, ..., Briegel, in prep

• Matrix-product states, MERA, and the zoo of unitary networks

- Interestingly, more generally: **MPS + “weighted graphs”**
- E.g., use networks to simulate **random quantum circuits** in quantum computing

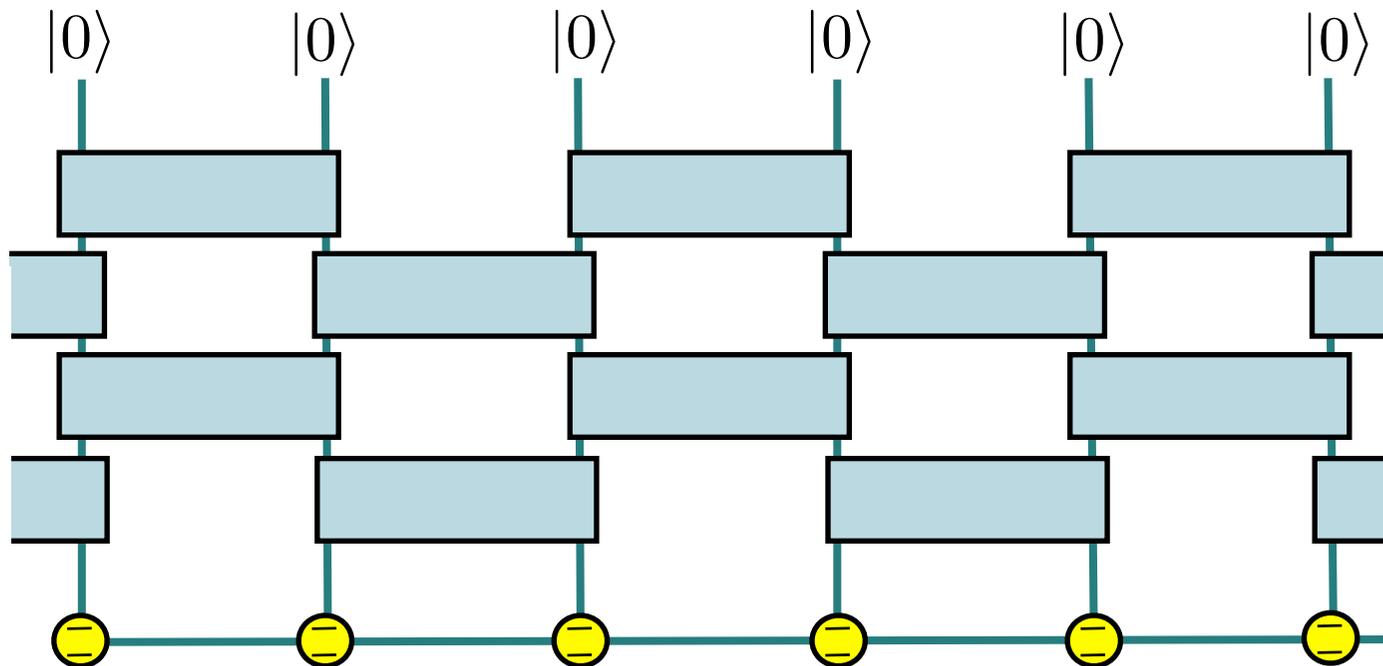


(Starting from product state, random phase gates and local gates, 12 qubits, 100 realizations)

• Matrix-product states, MERA, and the zoo of unitary networks

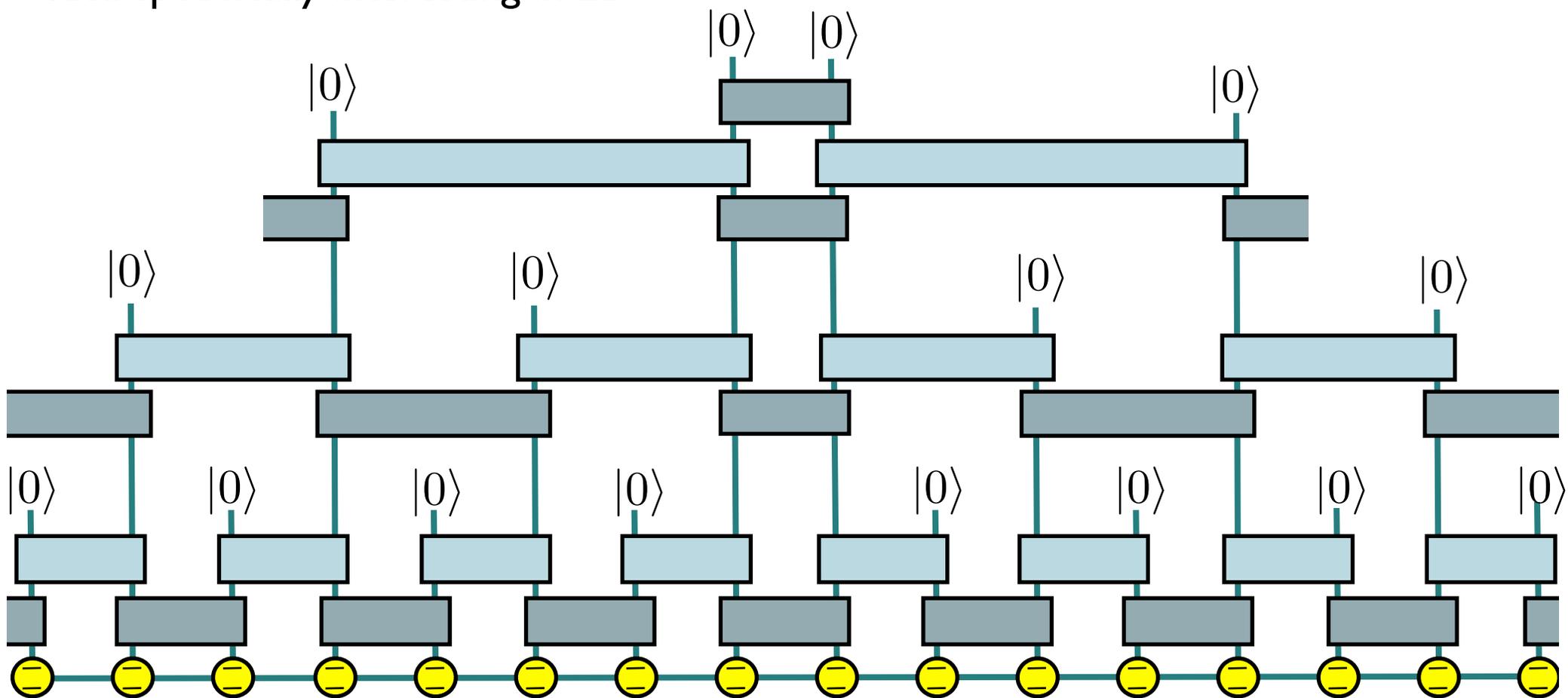
• Other classes of states:

Margolus partitioning of **quantum cellular automata** of fixed depth:



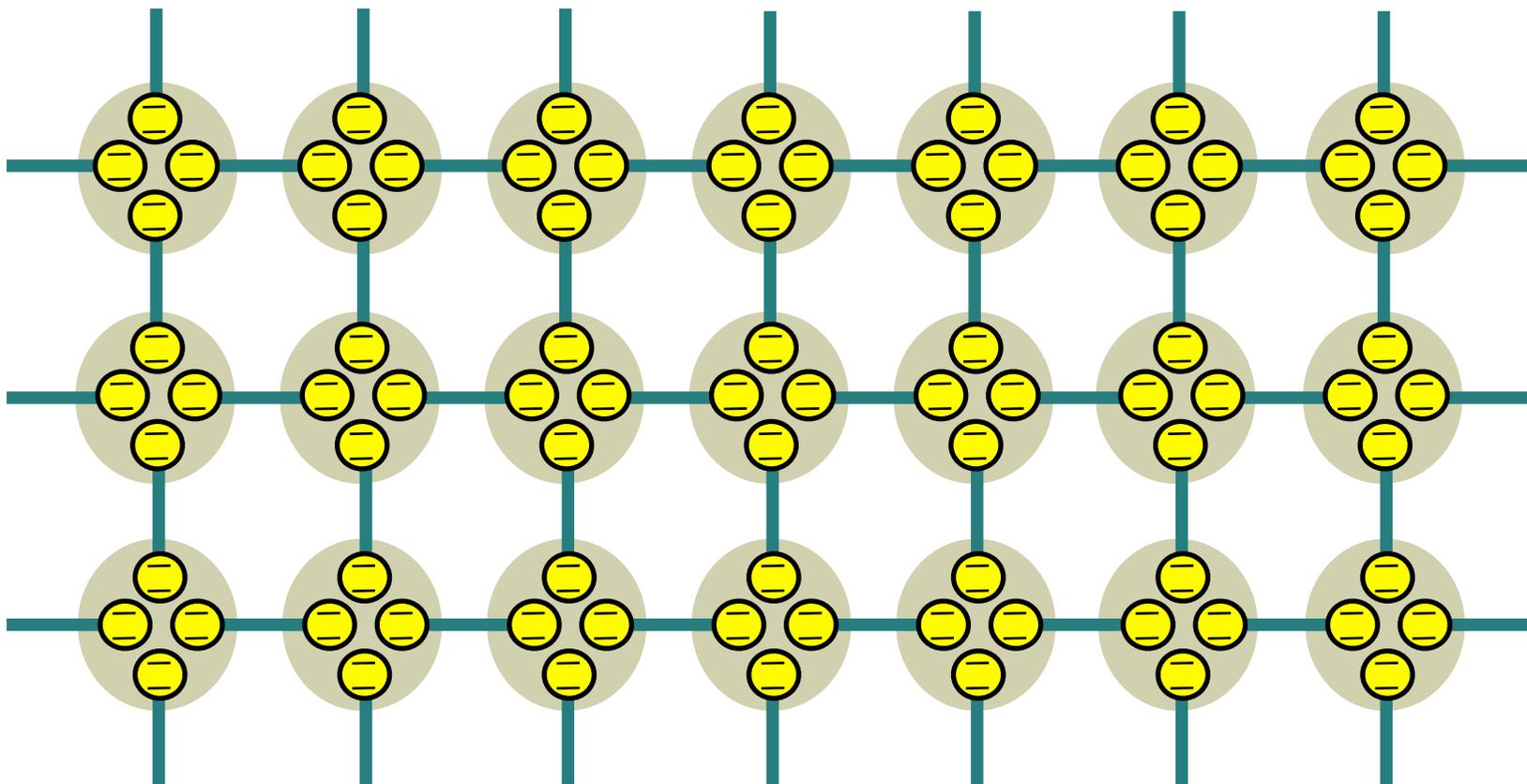
• Matrix-product states, MERA, and the zoo of unitary networks

- Unitary network of **MERA** (multiscale entanglement renormalization):
- “Disentangler” and “isometries”, scale invariant
- $\log(n)$ layers, contraction $O(n)$ effort
- Idea specifically interesting in 2D



- **Matrix-product states, MERA, and the zoo of unitary networks**

- **PEPS, projected entangled pair states**, higher-dimensional MPS, see Frank's talk



- **Lesson:** Approximate **ground states of quantum many-body systems** by tensor networks that can be efficiently contracted

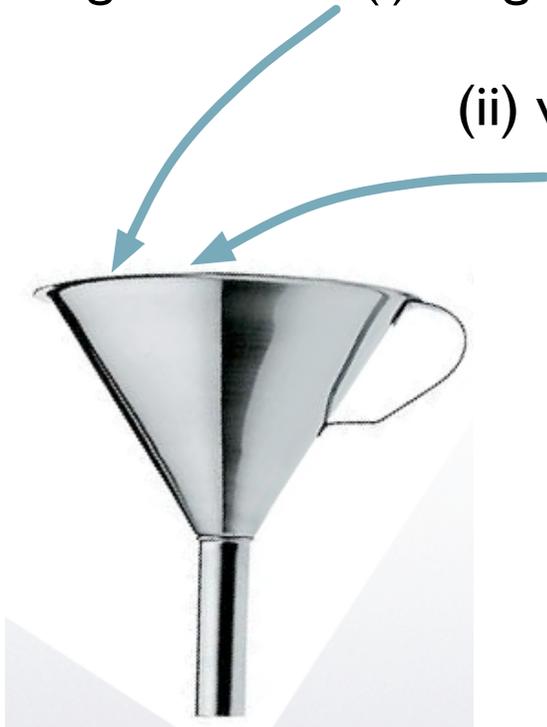
4. Flow and optimal control approach to simulating quantum many-body systems

(in progress!)

• Flow and optimal control approach to simulation

- How to **optimize** over such unitary networks?
- Approach: Bring ideas of (i) Wegner-flow, optimal control together with

(ii) variational principles



- **Starting point:** Write variational set again as **unitary network**

$$\mathcal{S}_D = \{U|\mathbf{0}\rangle : U \in U_D\} \quad U = \prod_j U_j$$

such that local properties computable

Flow and optimal control approach to simulation

- **Flow ideas:** “Diagonalize the Hamiltonian with infinitesimal unitaries”

$$\lim_{t \rightarrow \infty} U(t)^\dagger H U(t) = D$$

- In terms of **generator**: $U(t) = \mathcal{T} \exp \left(-i \int_0^t ds G(s) ds \right)$
- Consider **figure of merit**: $E(t) = \langle \mathbf{0} | U(t)^\dagger H U(t) | \mathbf{0} \rangle$

Lemma:
$$\min_{\text{tr}[G(t)^\dagger G(t)] = \varepsilon} \frac{dE(t)}{dt}$$

for “bracket” generator $G(t) \sim [|\mathbf{0}\rangle\langle\mathbf{0}|, U(t)^\dagger H U(t)]$

• Flow and optimal control approach to simulation

- **Flow ideas:** “Diagonalize the Hamiltonian with infinitesimal unitaries”

$$\lim_{t \rightarrow \infty} U(t)^\dagger H U(t) = D$$

- Of course, this **cannot** be done over the **unitary group** $U(d^n)$
- **Wegner’s flow renormalization:** *Expansions* in a parameter, truncate
- **Way out in the following:**

- 
- Use flow ideas to take it as a **method** to vary over unitary networks describing “data sets” in the Heisenberg picture

• Flow and optimal control approach to simulation

• For

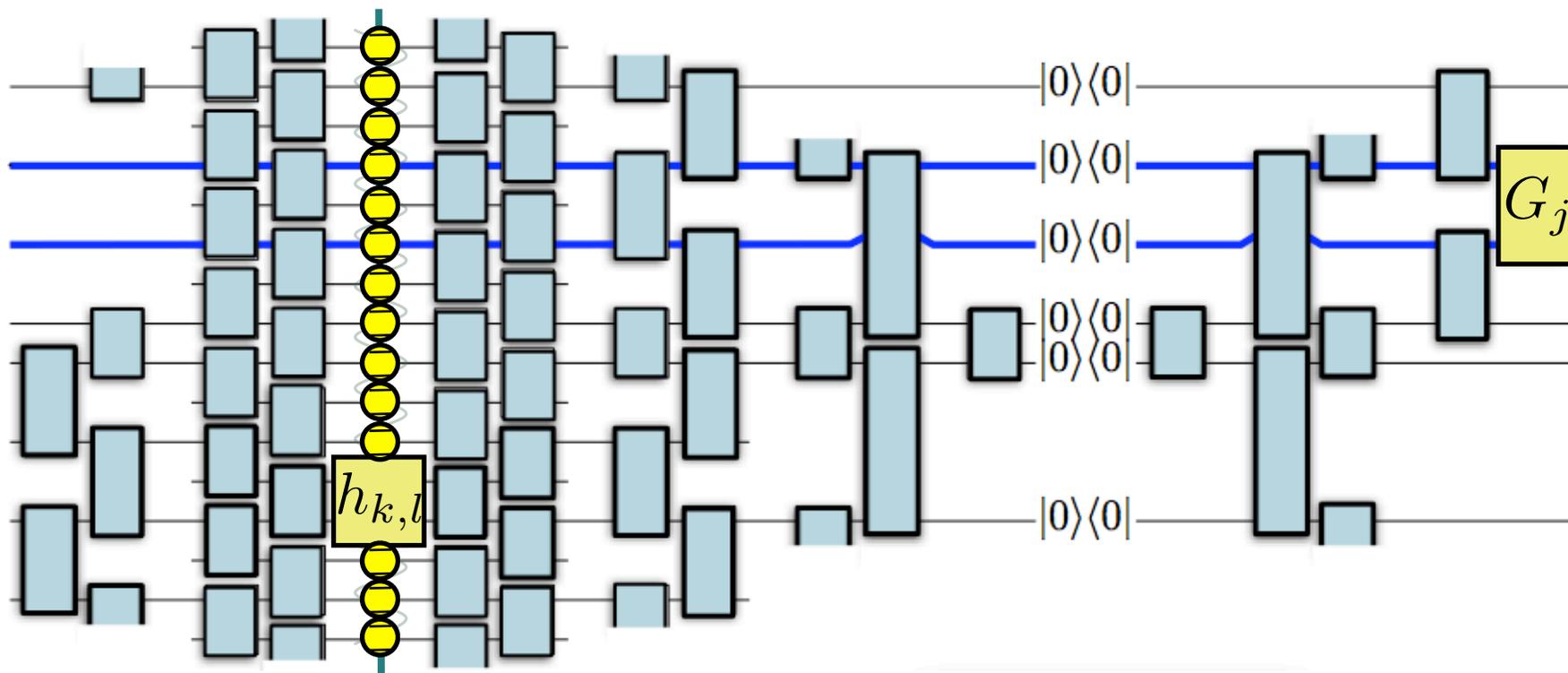
$$\partial_t E = \langle \mathbf{0} | \partial_t U^\dagger H U + U^\dagger H \partial_t U | \mathbf{0} \rangle$$
$$\partial_t U = -i \sum_{j=1}^M \left(\prod_{k=j+1}^M U_k \right) G_j \left(\prod_{k=1}^j U_k \right).$$
$$U(t) = \prod_{j=1}^M U_j(t)$$

• **Lemma:** Optimal generator $G_j \sim F_j + F_j^\dagger$

$$F_j = \text{tr}_{R_j} \left[\left(\prod_{k=1}^j U_k \right) | \mathbf{0} \rangle \langle \mathbf{0} | U^\dagger H \left(\prod_{k=j+1}^M U_k \right) \right]$$

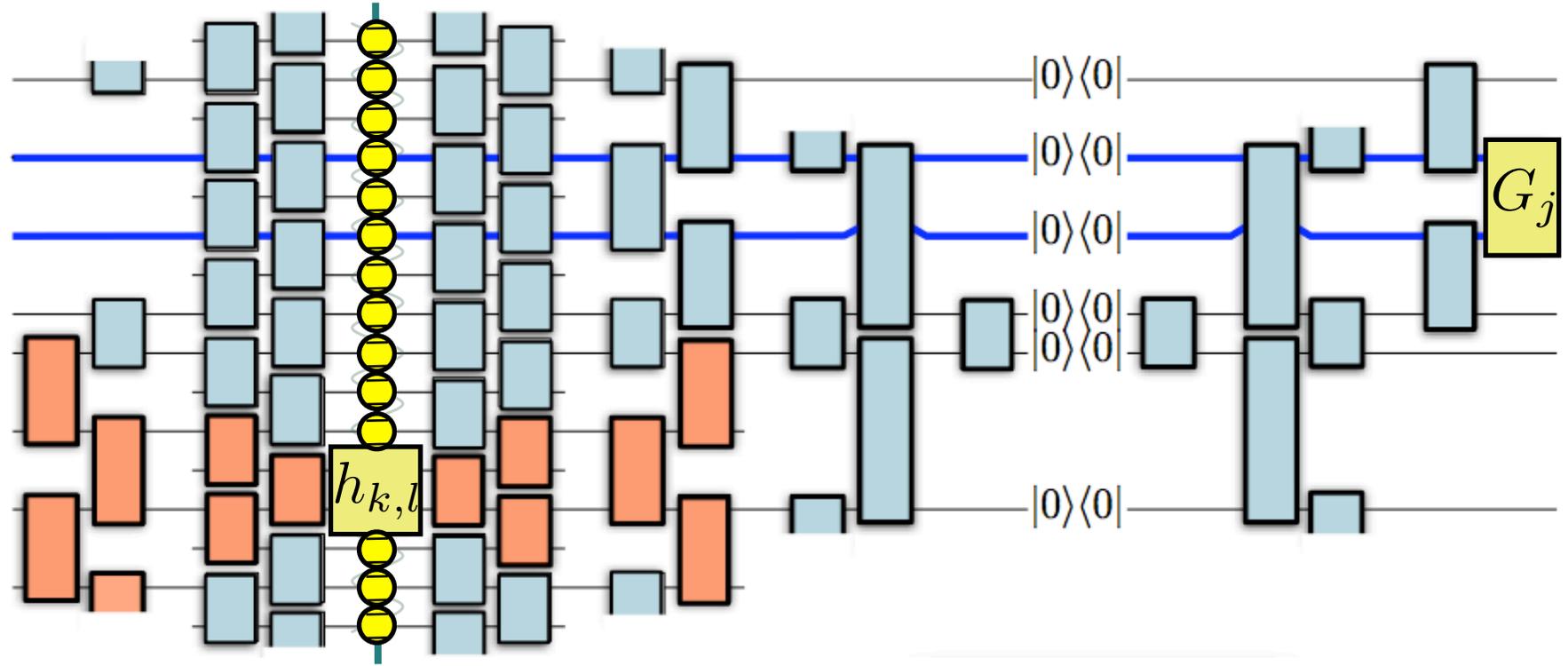
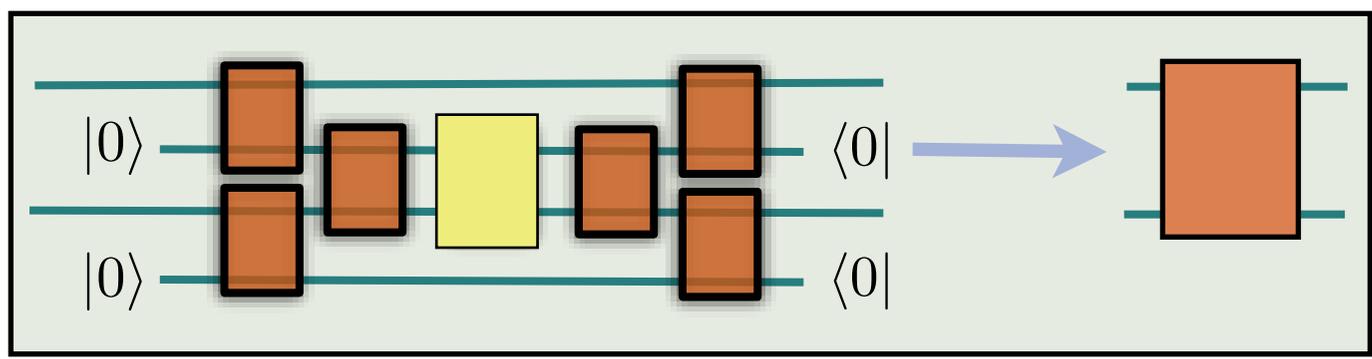
Flow and optimal control approach to simulation

- For example, for **MERA**: Hamiltonian and generator causal cone:



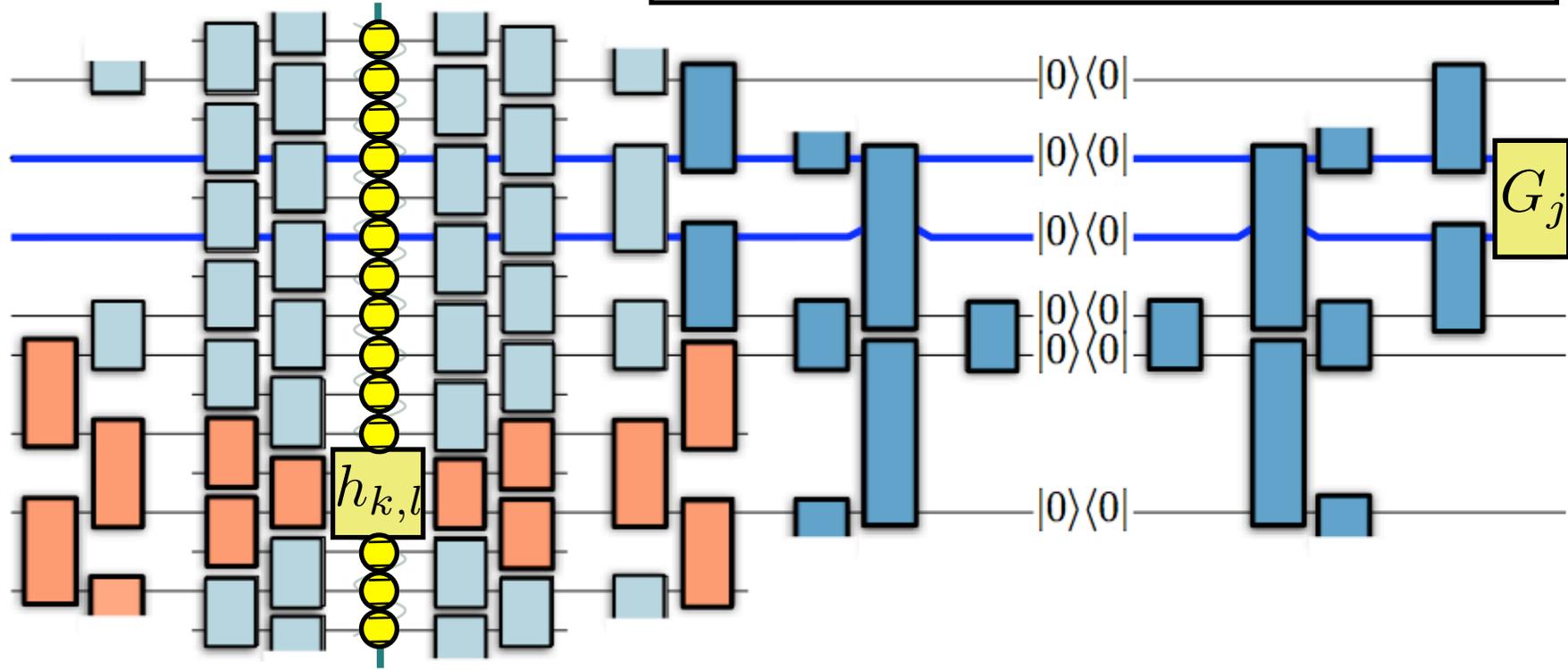
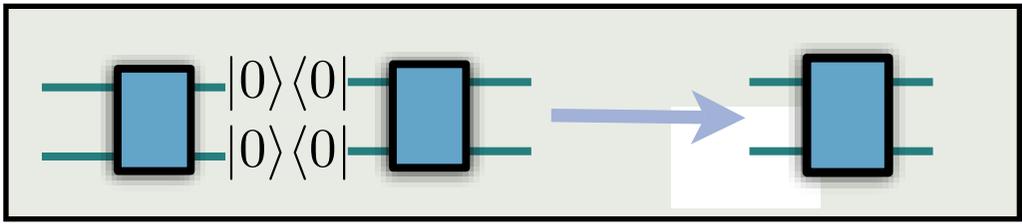
• **Flow and optimal control approach to simulation**

- For example, for **MERA**: Hamiltonian and generator causal cone:



Flow and optimal control approach to simulation

- For example, for **MERA**: Hamiltonian and generator causal cone:
- Optimal generator can be found with effort $O(n \log(n))$ for MERA, and $O(nD^3)$ for staircase



• Flow and optimal control approach to simulation

- Comparison with benchmark of DMRG, *Heisenberg-chain* of 28 spins

- *Staircase circuit*

$$H = -\frac{1}{2} \sum_{j=1}^n \left(J \sum_{k=1}^3 \sigma_j^k \sigma_{j+1}^k \right)$$

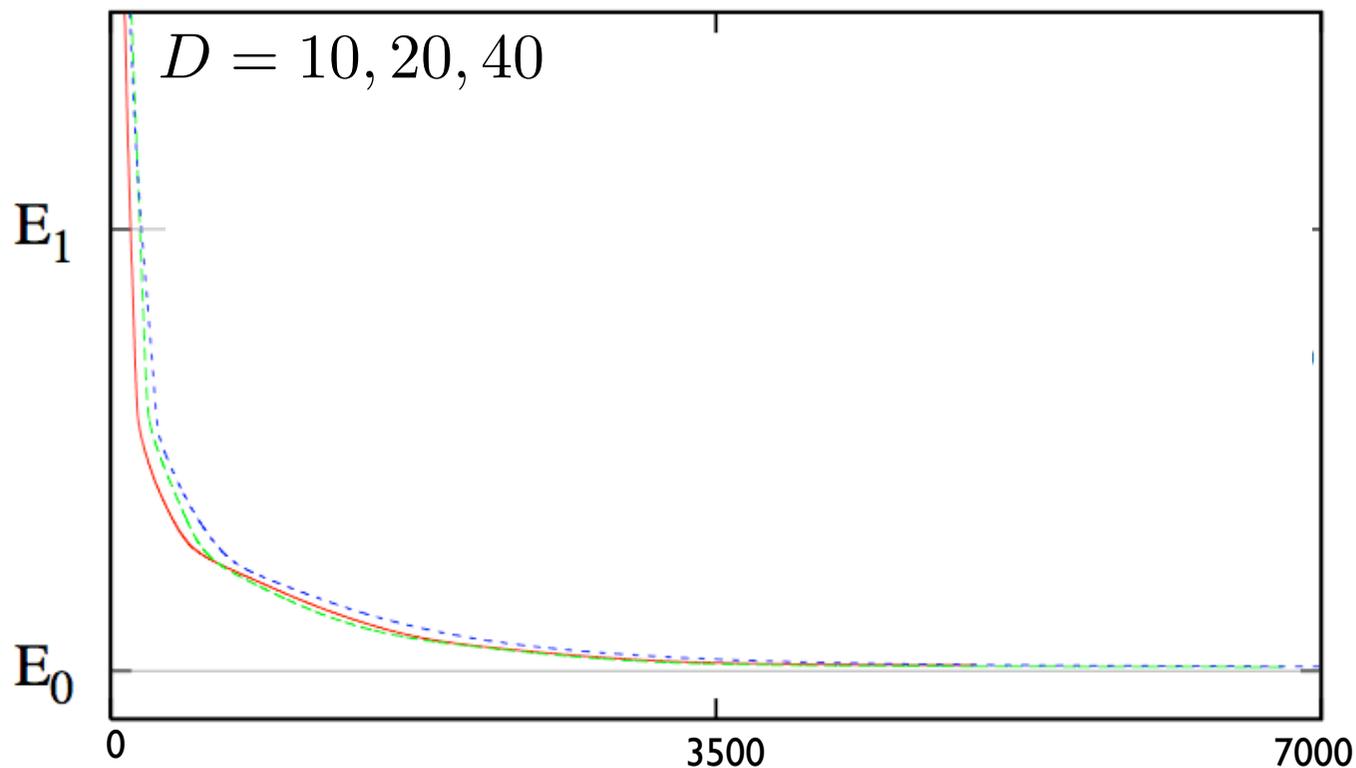
- Compared with ALPS

Exact: $E_0 = -52.44542$

$\Delta E = -0.49962$

ALPS DMRG/flow:

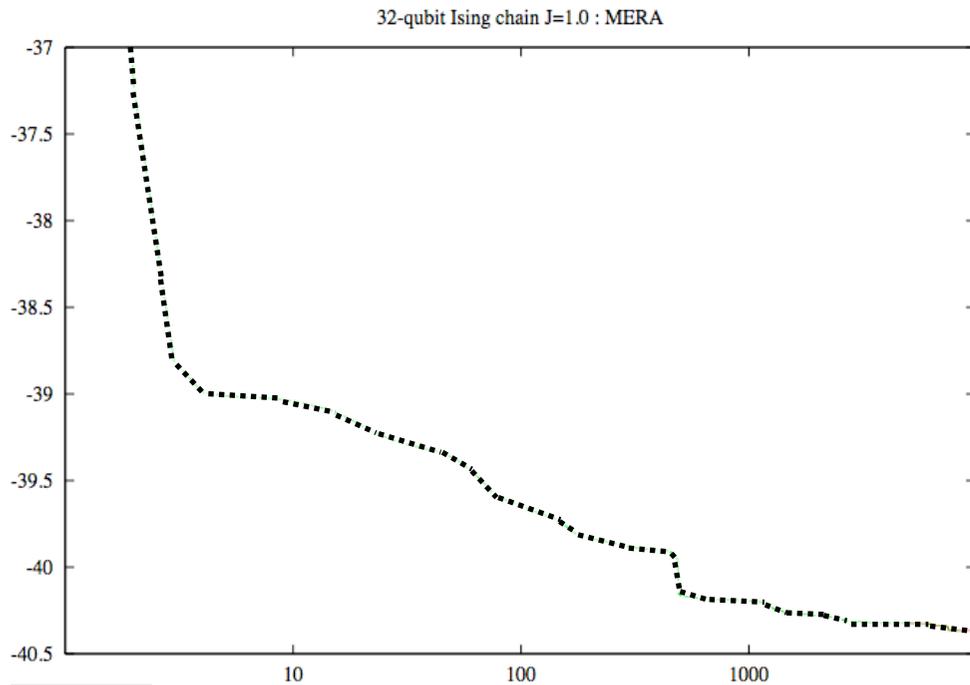
$E_0(20) = -52.44100$



- Does not get stuck in local minima

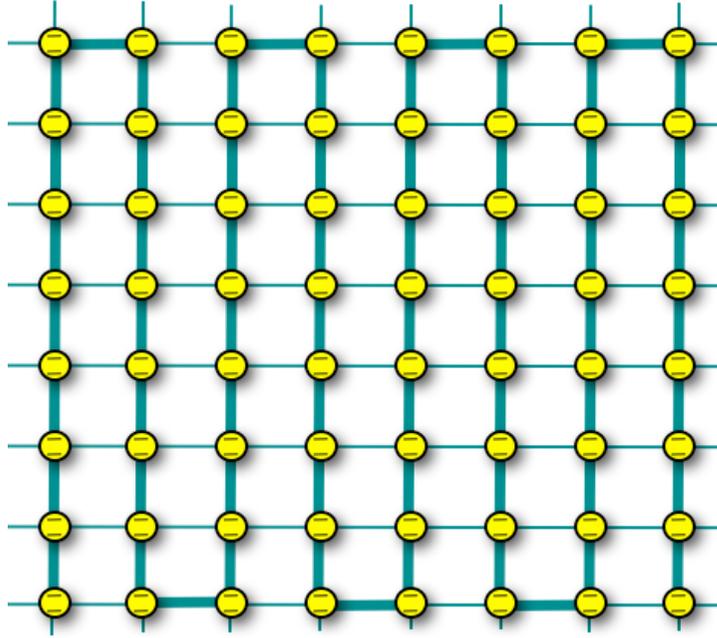
• Flow and optimal control approach to simulation

- MERA: Surprisingly, just as well as staircase (DMRG) for $D = 30$ open boundary condition *Ising chain* with $N = 32$



• Flow and optimal control approach to simulation

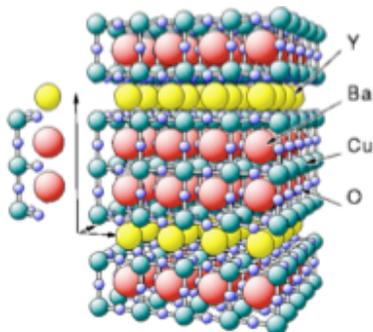
- Funny enough: If one (just for fun) makes use of a “snake”, as historically done in DMRG to simulate 2D-Ising systems, MERA performs not so badly



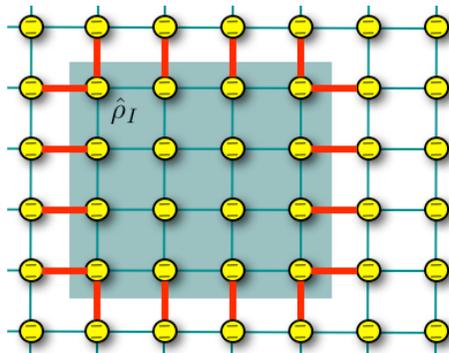
- Run of last night: Ising 8×8 , $E = -133.052$ (compared to $E = -112.124$ DMRG, $D = 30$)
 - But, needless to say, actual promise is in proper 2D MERA, ...

- Point of tutorial in a nutshell

- Summary:

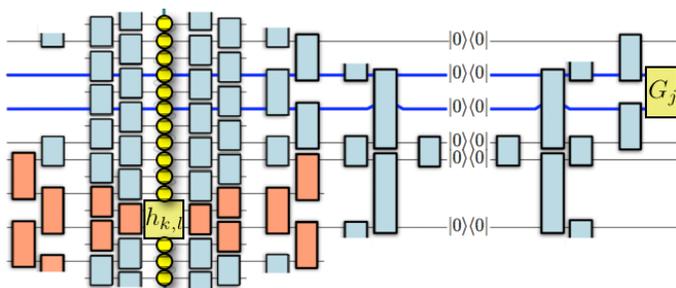


Many-body systems
interesting challenge



Locality of interactions
inherited by scaling of
entanglement:
area laws

Unwise/impossible to vary over
all states: Look for smart much
smaller sets of
variational states



Flow approaches may bring
together optimal control ideas
and simulation

$$|I\rangle = \sum_{\alpha=1}^D |\alpha, \alpha\rangle$$

$$\mathcal{P}^{(j)} = \sum_{i=1}^d \sum_{\alpha, \beta=1}^D A_{i_j, \alpha, \beta}^{(j)} |i\rangle\langle \alpha, \beta|$$

$$|\psi\rangle = \sum_{i_1, \dots, i_N} \text{tr}[A_{i_1}^{(1)} A_{i_2}^{(2)} \dots A_{i_N}^{(N)}] |i_1, i_2, \dots, i_N\rangle$$

Matrix-product states as
in DMRG satisfy area laws, MERA and
MPS+WGS ... can also efficiently be
contracted

Thanks for your attention!