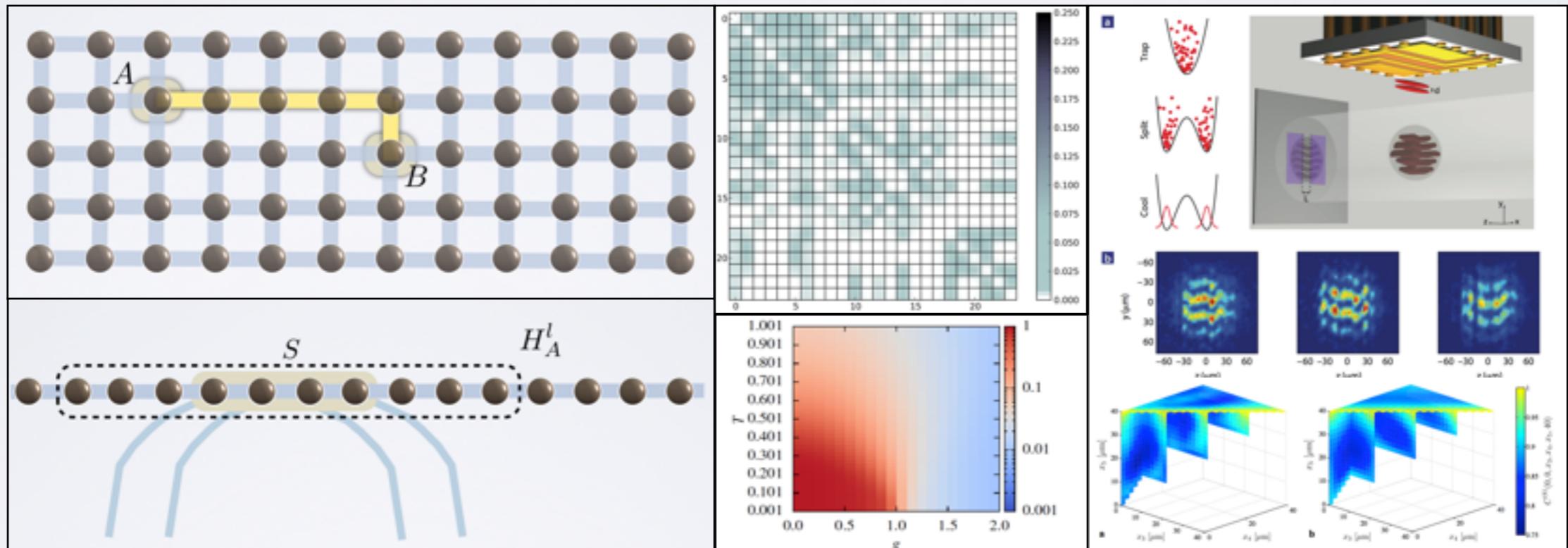


Analytical and numerical methods

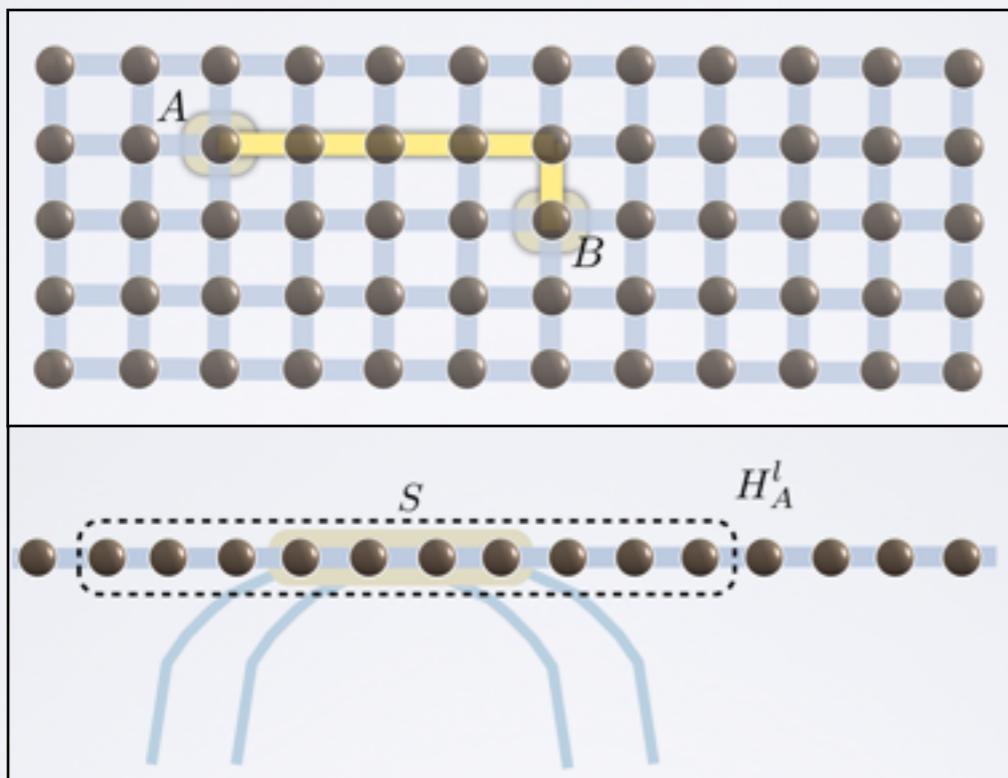


for quantum many-body systems

Jens Eisert, FU Berlin

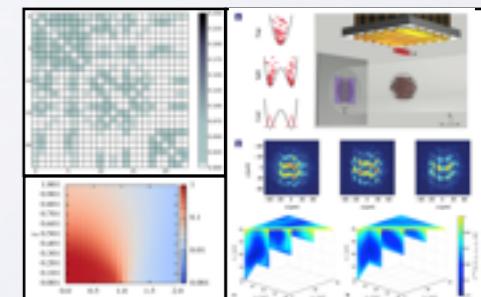


Analytical methods



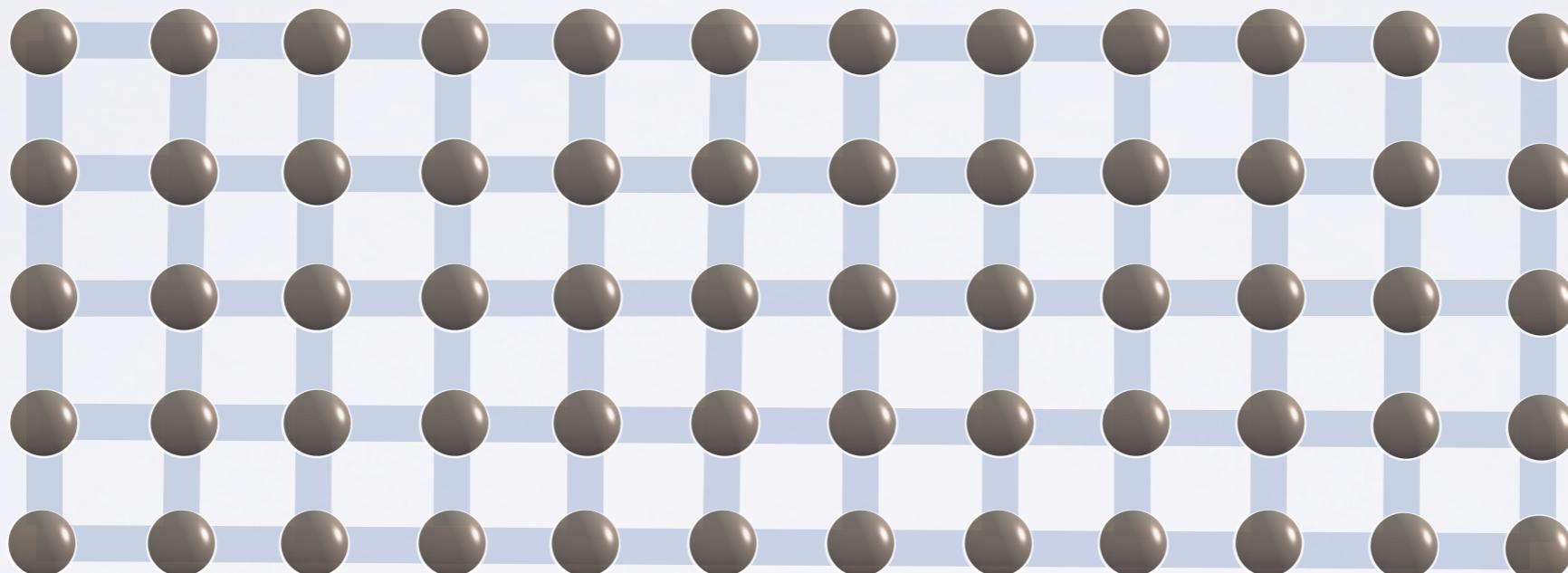
for quantum many-body systems

Jens Eisert, FU Berlin

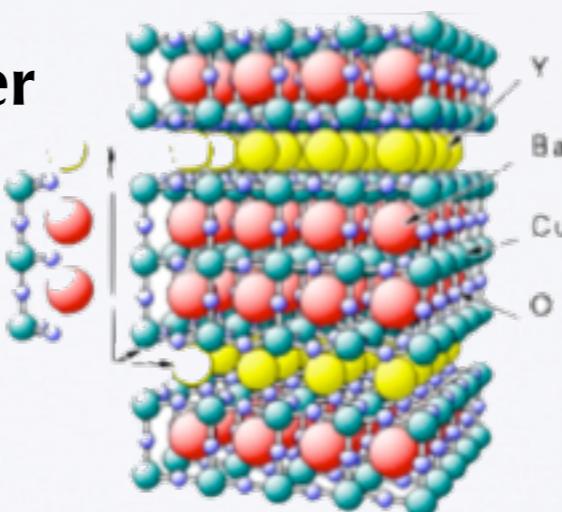


Ground states of local Hamiltonians

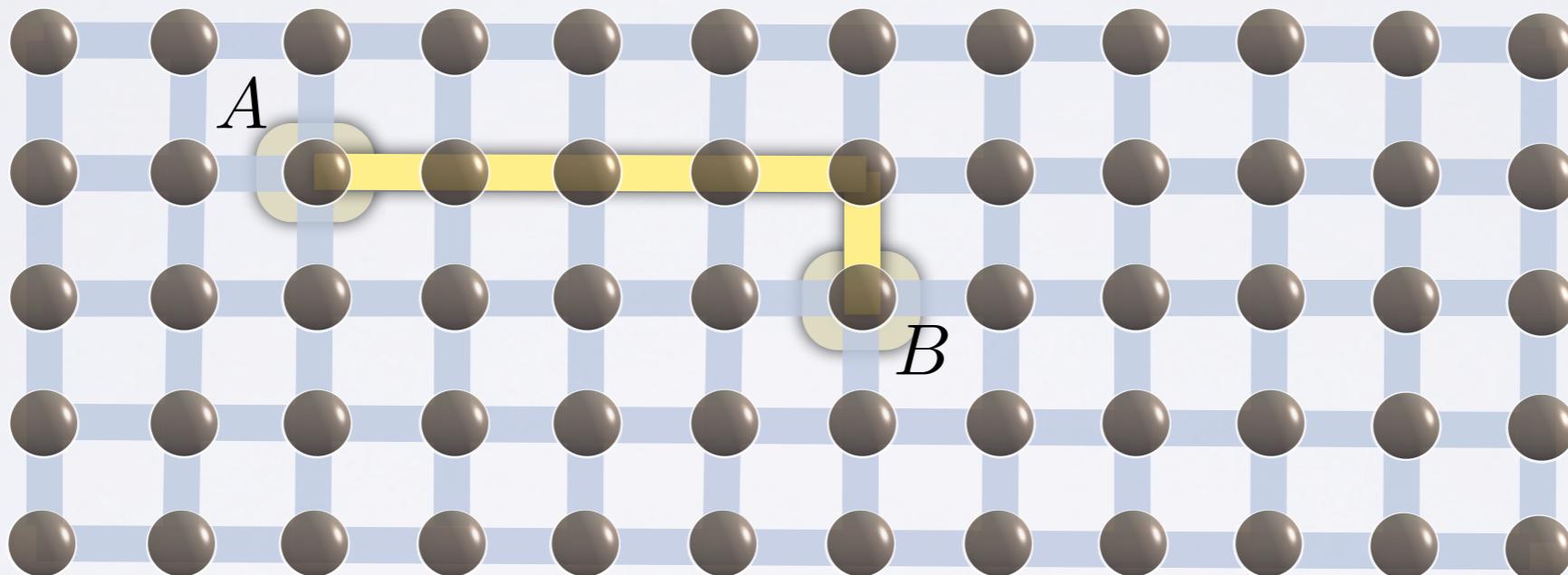
- Local Hamiltonians $H = \sum_j h_j$



- Models for **strongly correlated matter**



Ground states of local Hamiltonians



- Energy gap $\Delta(H) = E_1 - E_0 > 0$
- Ground states of gapped models have **exponentially decaying correlations**

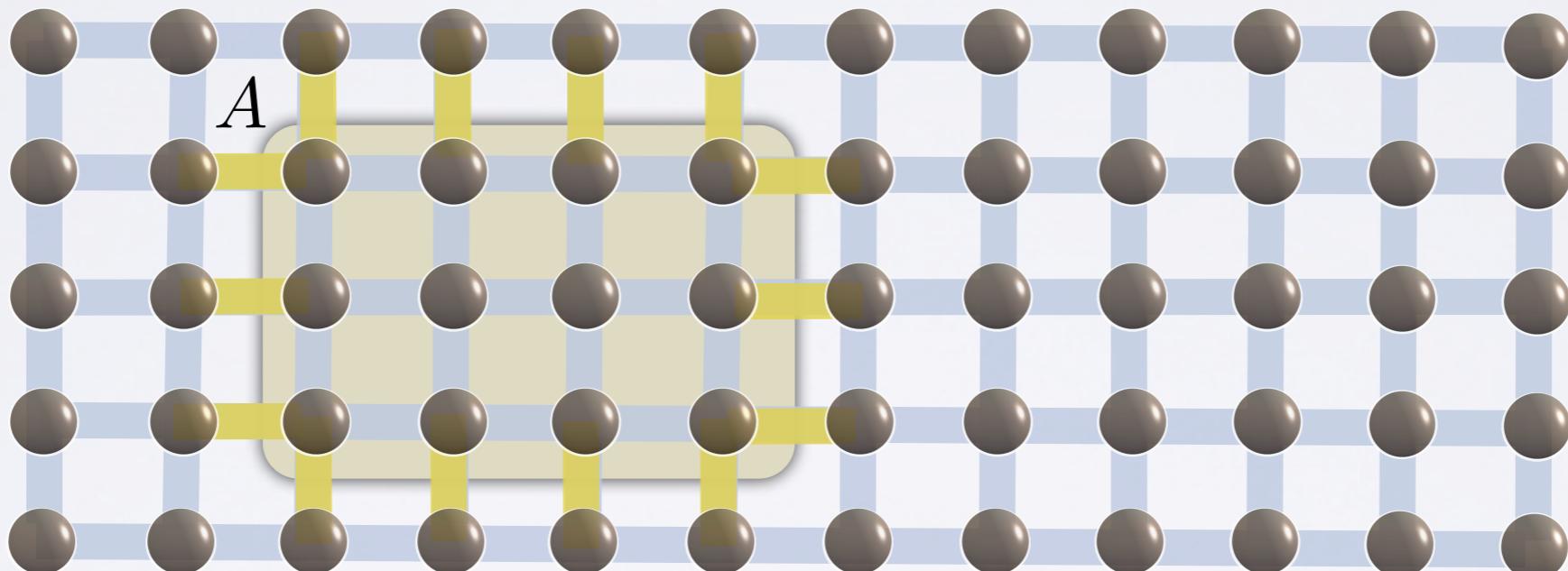
- Proof based on Lieb-Robinson bounds

Hastings, Koma, Commun Math Phys 265, 781 (2006)
Nachtergael, Sims, Commun Math Phys 265, 119 (2006)

- Combinatorial proof (detectability lemma)

Aharonov, Arad, Landau, Vazirani, arXiv:1011.3445

Area laws



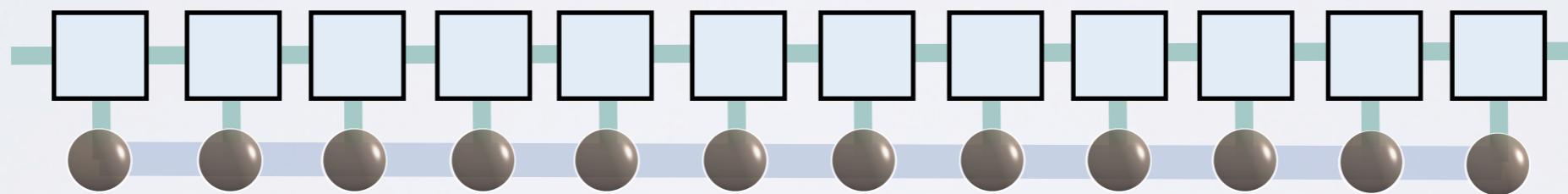
- Area laws for the **entanglement entropy** $S(\rho_A) = O(|\partial A|)$
- Proven in >1D for gapped free bosonic and fermionic systems and models in same quantum phase as one fulfilling an area law

Area laws



- All gapped models in **1D** satisfy an area law

Tensor networks



- **Matrix-product states** approximate GS of gapped models well: Functioning of DMRG
- Higher-dimensional **tensor network states**

Overview over talk



1. What happens at finite temperature?

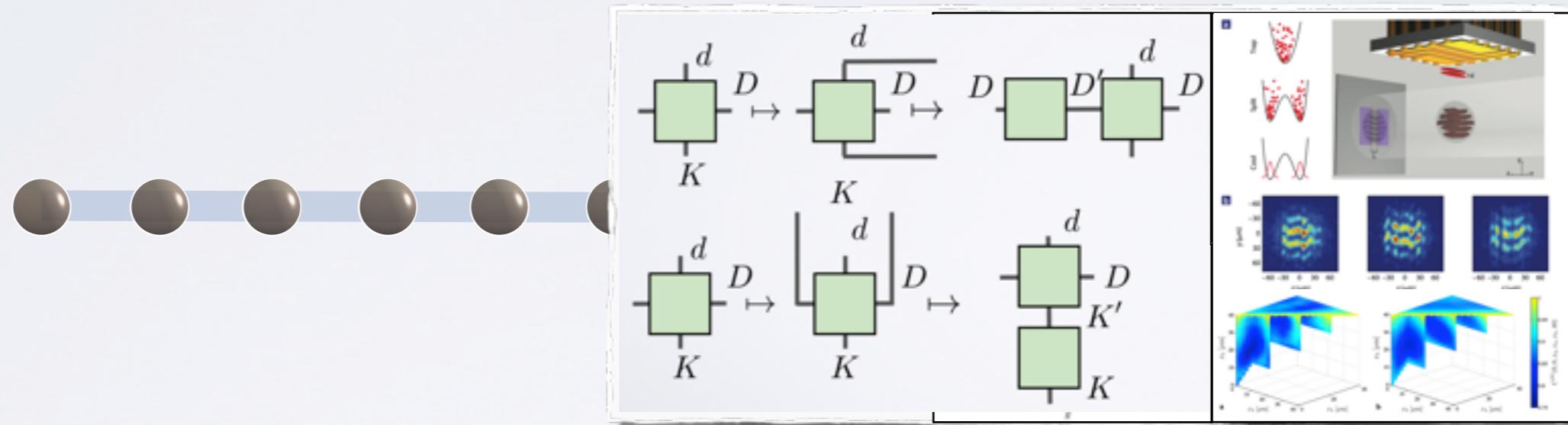
- Locality of temperature
- Clustering of correlations
- Tensor network approximations



2. Many-body localisation and disordered models?

- Many complementing views on the problem
- Dynamical and static readings
- A new result on matrix-product states

Announcement of posters :)



Posters on numerical techniques for strongly correlated systems

- Tensor network methods in *quantum chemistry*
- Continuous matrix-product states and *quantum field tomography*
- A positive tensor network methods for simulating *open systems*

Krumnow, Legeza, Schneider, Eisert, soon (2014)

Steffens, Friesdorf, Langen, Rauer, Schweigler, Huebener, Schmiedmayer, Riofrio, Eisert, arXiv:1406.3632
Steffens, Riofrio, Huebener, Eisert, arXiv:1406.3631

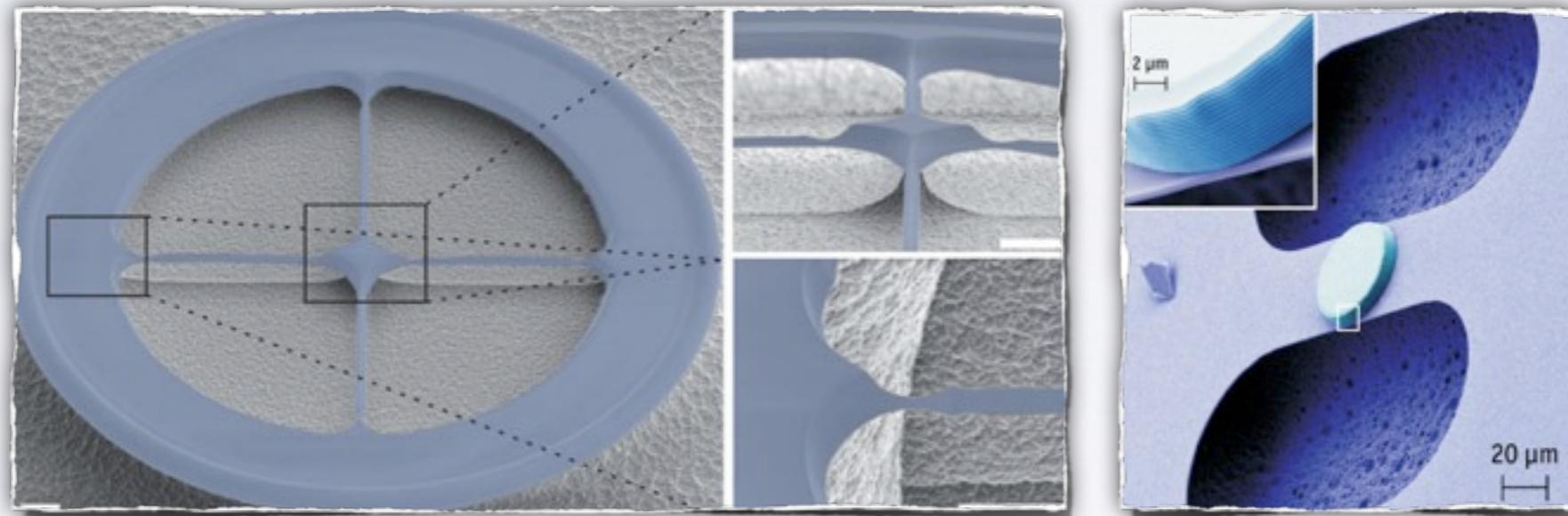
Kliesch, Gross, Eisert, Phys Rev Lett 113 (2014)

Jaschke, Silvi, Calarco, Werner, Eisert, Montangero, soon (2014)

Clustering of correlations in thermal states

Locality of temperature?

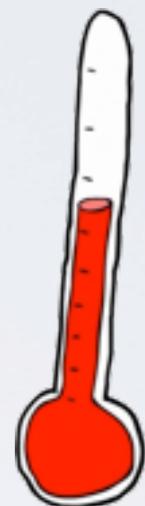
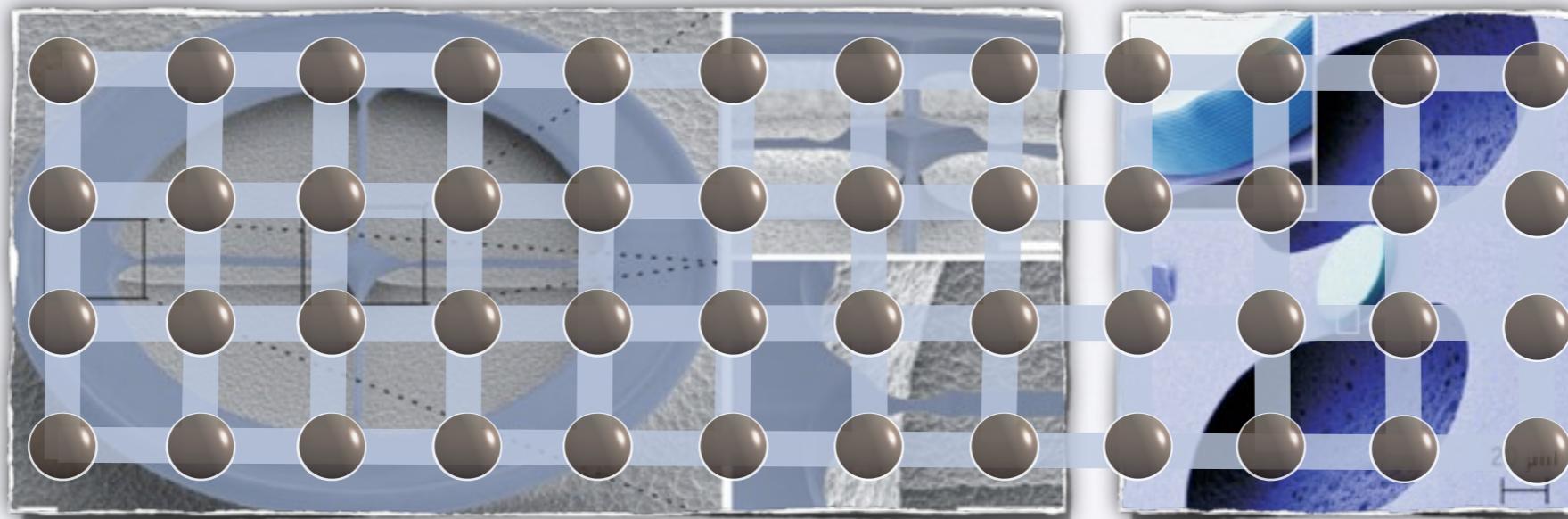
- At what **length scales** is temperature well-defined?



Pothier, Gueron, Birge, Esteve, Devoret, Phys Rev Lett 79, 3490 (1997)
Peng, Su, Liu, Yu, Cheng, Bao, Nanoscale 5, 9532 (2013)
Hartmann, Mahler, Hess, Phys Rev Lett 93, 080402 (2004)
Ferraro, Garcia-Saez, Acin, Europhys Lett 98, 10009 (2012)

Locality of temperature?

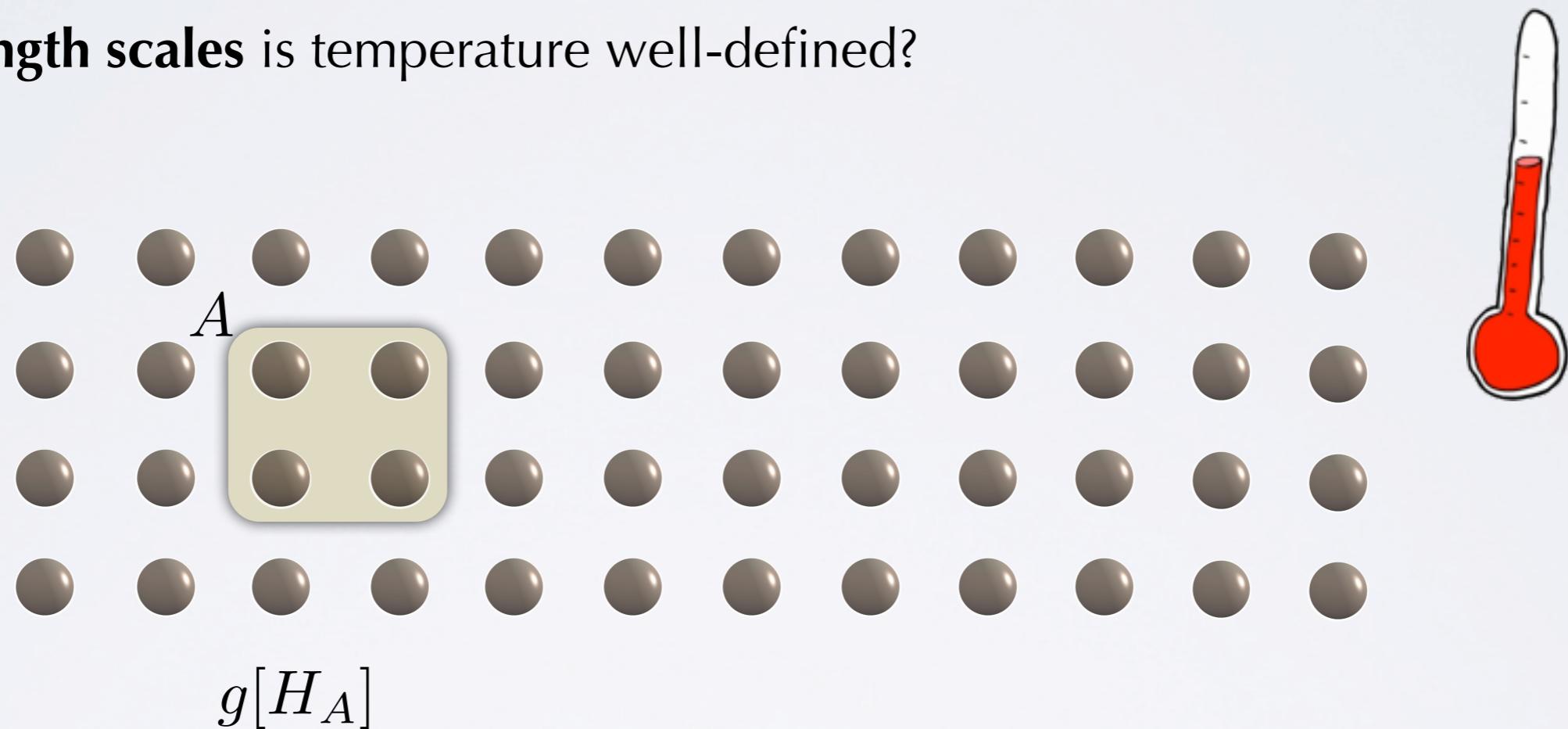
- At what **length scales** is temperature well-defined?



Pothier, Gueron, Birge, Esteve, Devoret, Phys Rev Lett 79, 3490 (1997)
Peng, Su, Liu, Yu, Cheng, Bao, Nanoscale 5, 9532 (2013)
Hartmann, Mahler, Hess, Phys Rev Lett 93, 080402 (2004)
Ferraro, Garcia-Saez, Acin, Europhys Lett 98, 10009 (2012)

Locality of temperature?

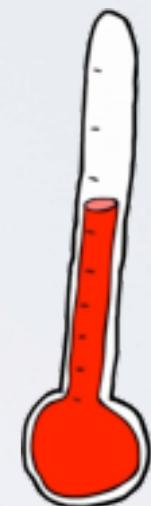
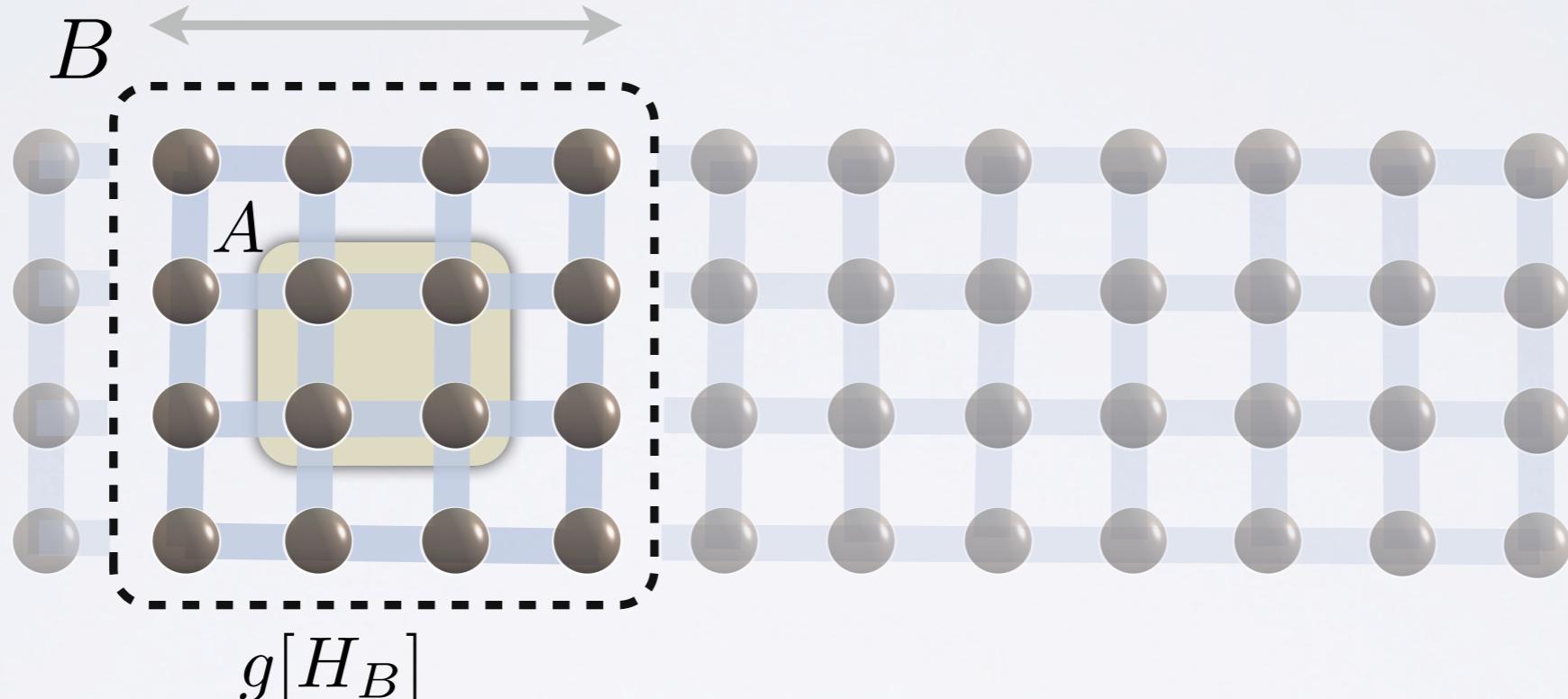
- At what **length scales** is temperature well-defined?



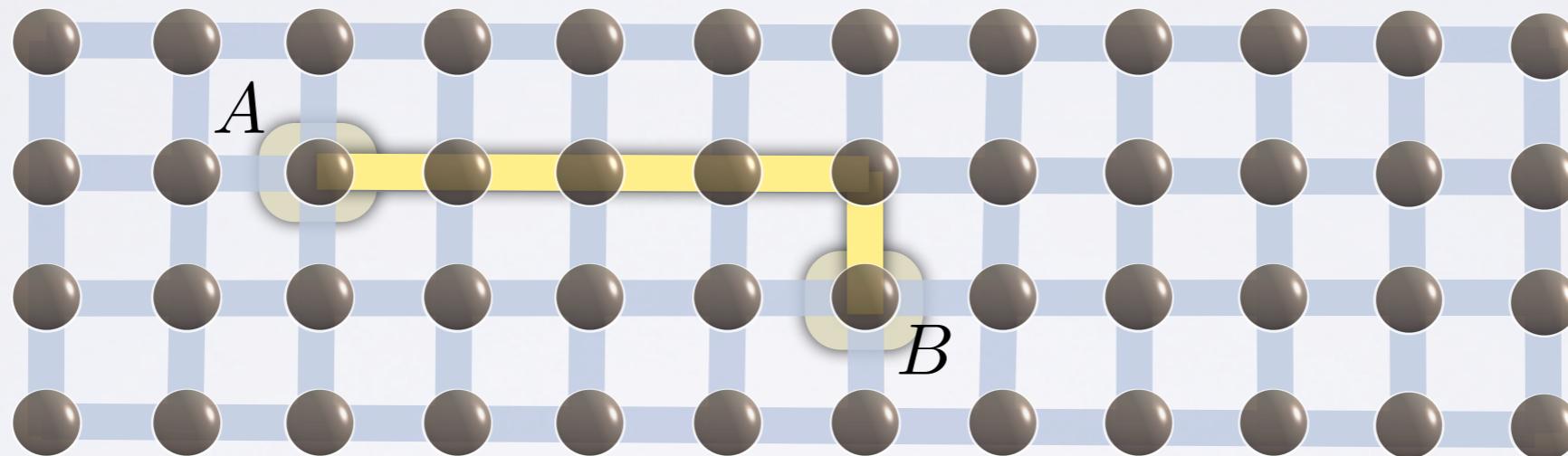
- Gibbs states $g[H] = \frac{e^{-\beta H}}{\text{tr}(e^{-\beta H})}$

Locality of temperature?

- At what **length scales** is temperature well-defined?



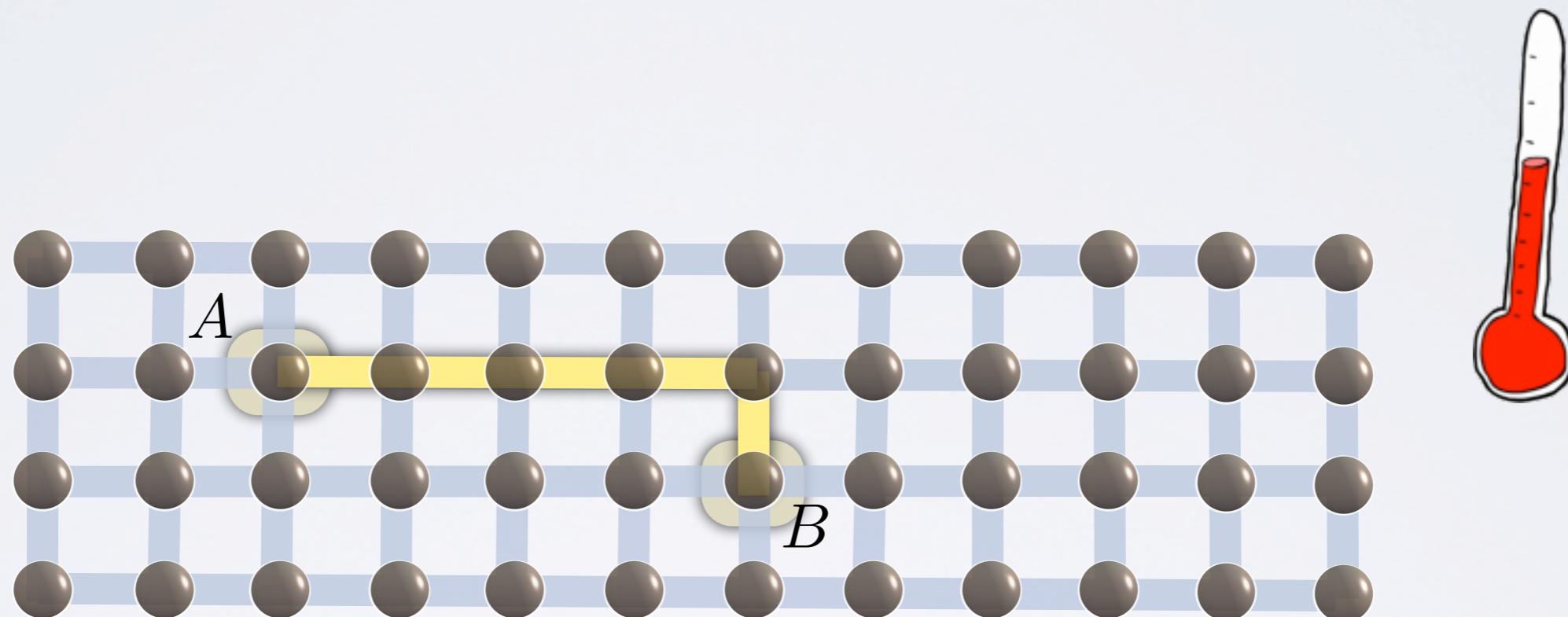
Thermal states of quantum many-body systems



- Again, GS of gapped Hamiltonians have clustering correlations

• Is there a thermal analogue?

Thermal states of quantum many-body systems



- **Critical temperature**, dependent only on crude properties of graph (+ coupling strength), above which correlations cluster?
- Long-standing **open question**, results known for **classical and continuum models**, some (few) insights into quantum lattice models

Araki, Commun Math Phys 38,1 (1974)

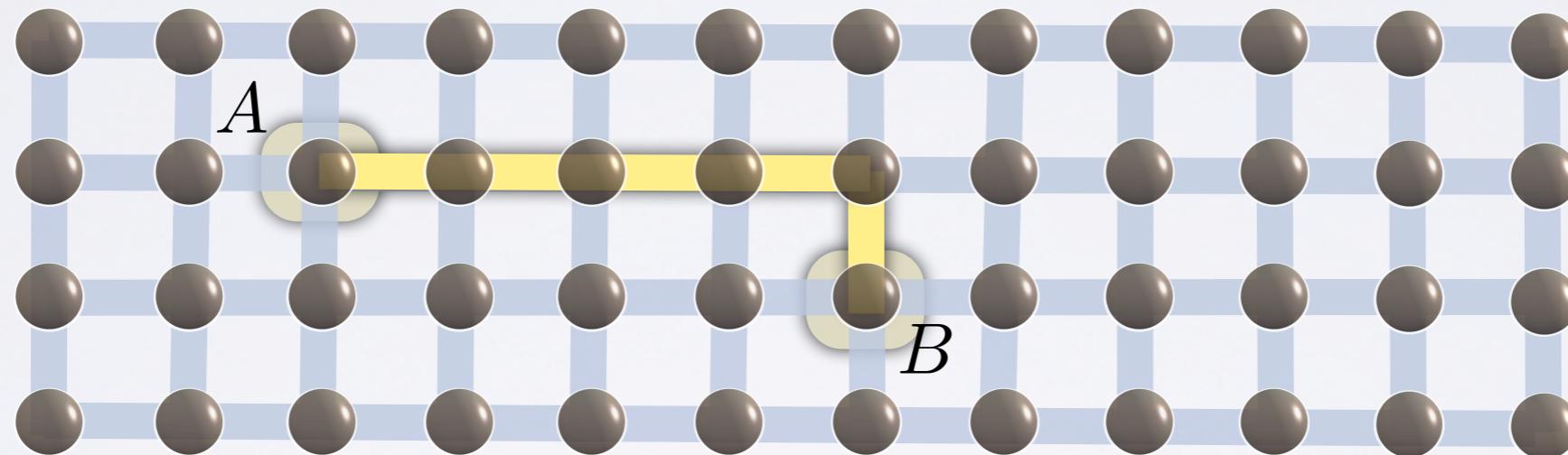
Ruelle, Rev Mod Phys 36, 580 (1964)

Ginibre, J Math Phys 6, 252 (1965)

Greenberg, Commun Math Phys 13, 335 (1969)

Brattelli, Robinson, Operator algebras in quantum statistical mechanics (Springer, 1981)

Thermal states of quantum many-body systems



- Yes :)

General clustering of correlations at high temperatures

$$\xi(\beta) = \left| 1 / \ln(\alpha e^{2|\beta|J} (e^{2|\beta|J} - 1)) \right|$$



- **Clustering of correlations in thermal states:** Consider local Hamiltonian on arbitrary regular lattice, $J := \max \|h_k\|$ coupling strength, then exists critical inverse temperature

$$\beta^* := \log((1 + \sqrt{1 + 4/\alpha})/2)/(2J)$$

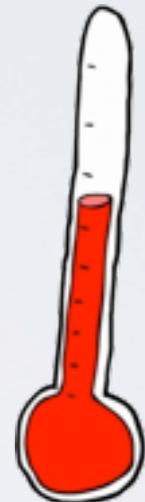
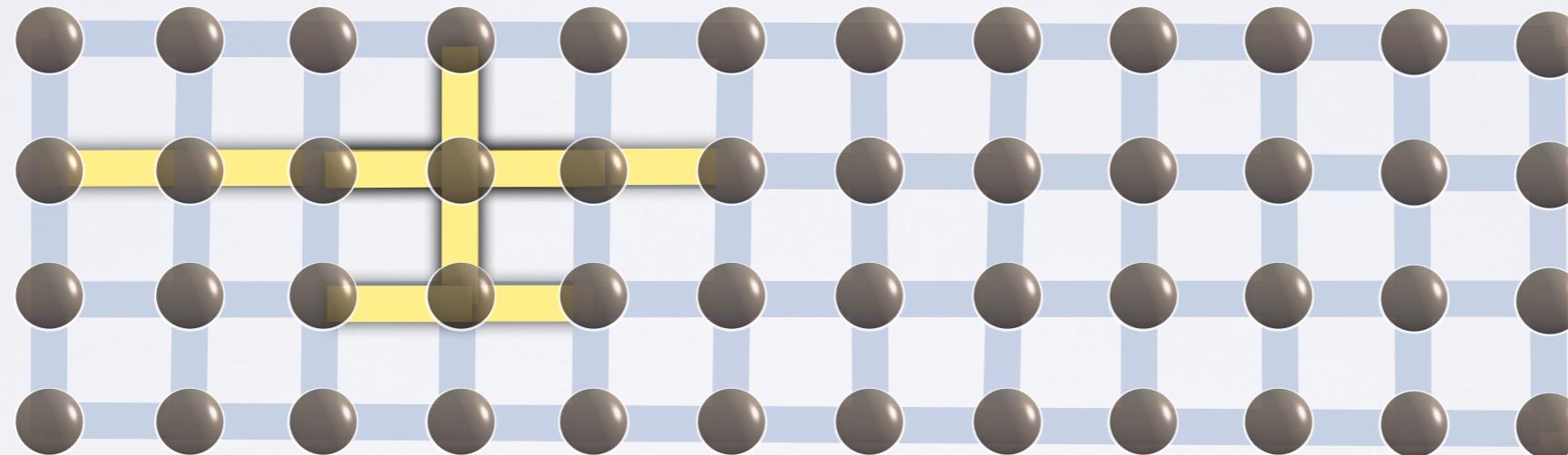
such that for all $\beta < \beta^*$ and $d(A, B) \geq L_0$

$$C_{g[H]}(A, B) \leq \frac{4 \min\{|\partial A|, |\partial B|\}}{\log(3)} \frac{\|f\| \|g\|}{1 - e^{-1/\xi(\beta)}} e^{-d(A, B)\xi(\beta)}$$

$$\xi(\beta) := \left| 1 / \ln(\alpha e^{2|\beta|J} (e^{2|\beta|J} - 1)) \right|$$

- α lattice animal constant
- General statement for arbitrary lattices and covariances

Lattice animal constants



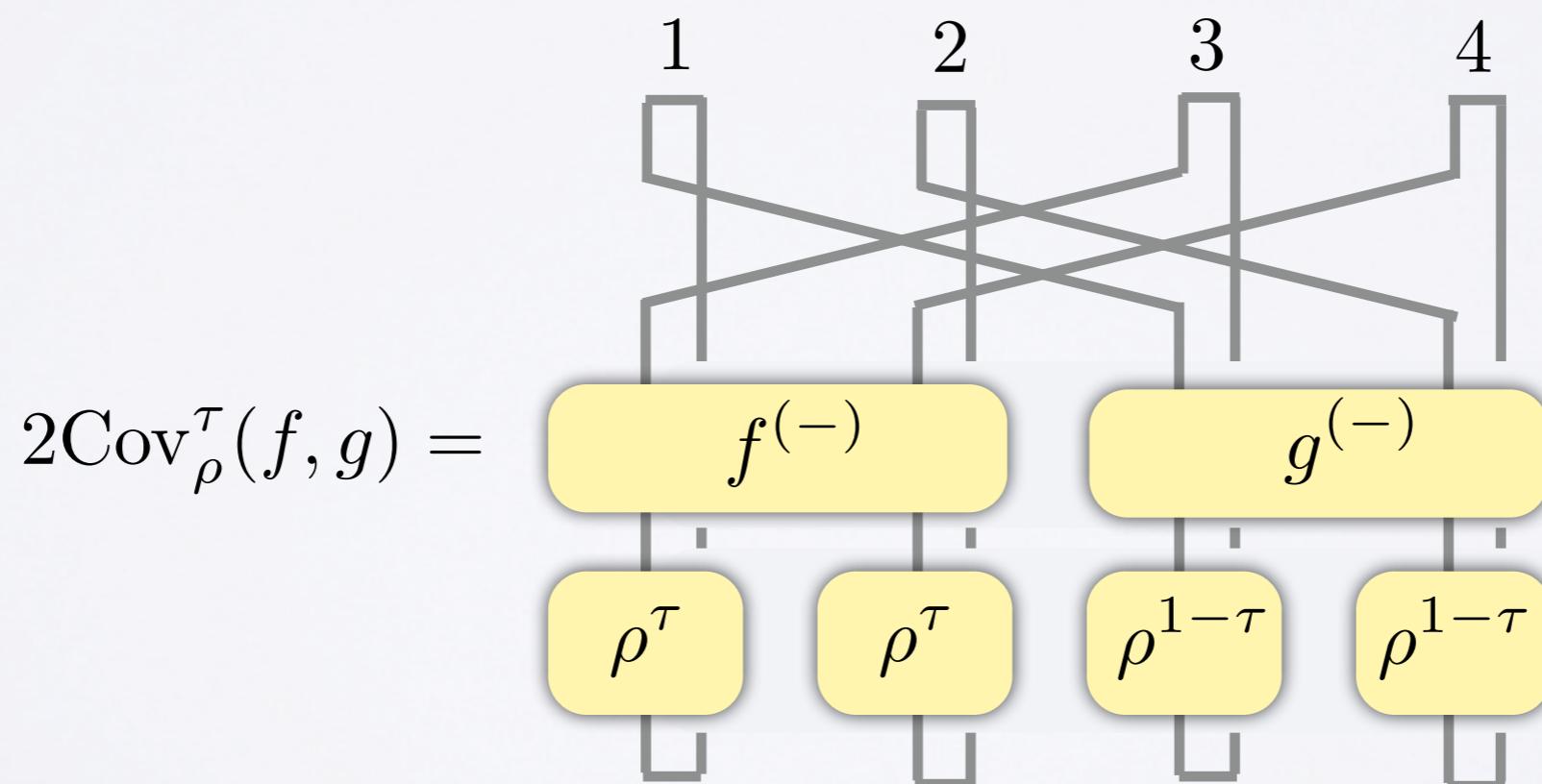
- Connected set of edges: **Lattice animal**
- Number a_m of lattice animals F of size $m = |F|$
- Lattice animal constant: Smallest α such that $a_m \leq \alpha^m$

Flavour of proof

Define **generalized covariance** $\text{Cov}_\rho^\tau(f, g) = \text{tr}(\rho^\tau f \rho^{1-\tau} g) - \text{tr}(\rho f) \text{tr}(\rho g)$, $\tau \in [0, 1]$

↓
Multiple "swap-trick"

Write $\text{Cov}_\rho^\tau(f, g) = \frac{1}{2} \text{tr} \left(\mathcal{S}^{(1,3)} \mathcal{S}^{(2,4)} (f^{(-)} \otimes g^{(-)}) (\rho^\tau \otimes \rho^\tau \otimes \rho^{1-\tau} \otimes \rho^{1-\tau}) \right)$,
on four copies, where $f^{(-)} = f \otimes 1 - 1 \otimes f$



Flavour of proof

Define **generalized covariance** $\text{Cov}_\rho^\tau(f, g) = \text{tr}(\rho^\tau f \rho^{1-\tau} g) - \text{tr}(\rho f) \text{tr}(\rho g)$, $\tau \in [0, 1]$

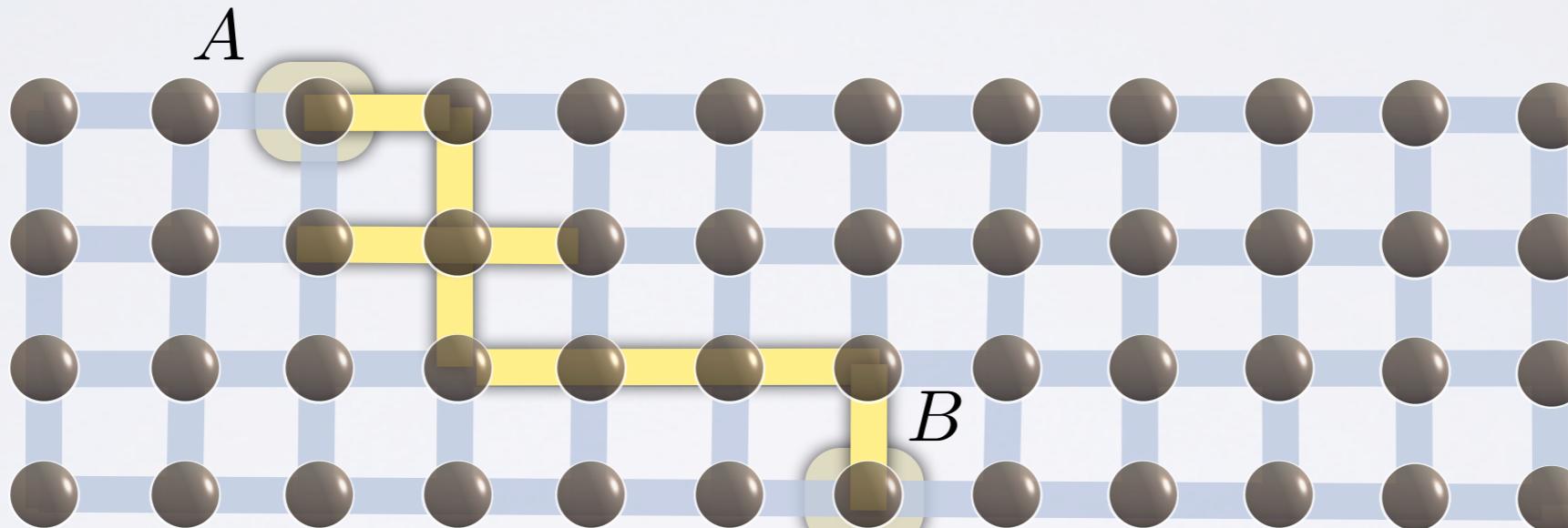
↓
Multiple "swap-trick"

Write $\text{Cov}_\rho^\tau(f, g) = \frac{1}{2} \text{tr} \left(\mathcal{S}^{(1,3)} \mathcal{S}^{(2,4)} (f^{(-)} \otimes g^{(-)}) (\rho^\tau \otimes \rho^\tau \otimes \rho^{1-\tau} \otimes \rho^{1-\tau}) \right)$,
on four copies, where $f^{(-)} = f \otimes 1 - 1 \otimes f$

↓
Cluster expansion of new Hamiltonian \tilde{H}

$$\frac{e^{-\beta \tilde{H}}}{\text{tr}(e^{-\beta \tilde{H}})} = \rho^\tau \otimes \rho^\tau \otimes \rho^{1-\tau} \otimes \rho^{1-\tau}$$

Flavour of proof



Symmetry: Only clusters connecting A and B contribute

Cluster expansion of new Hamiltonian \tilde{H}

$$\frac{e^{-\beta \tilde{H}}}{\text{tr}(e^{-\beta \tilde{H}})} = \rho^\tau \otimes \rho^\tau \otimes \rho^{1-\tau} \otimes \rho^{1-\tau}$$

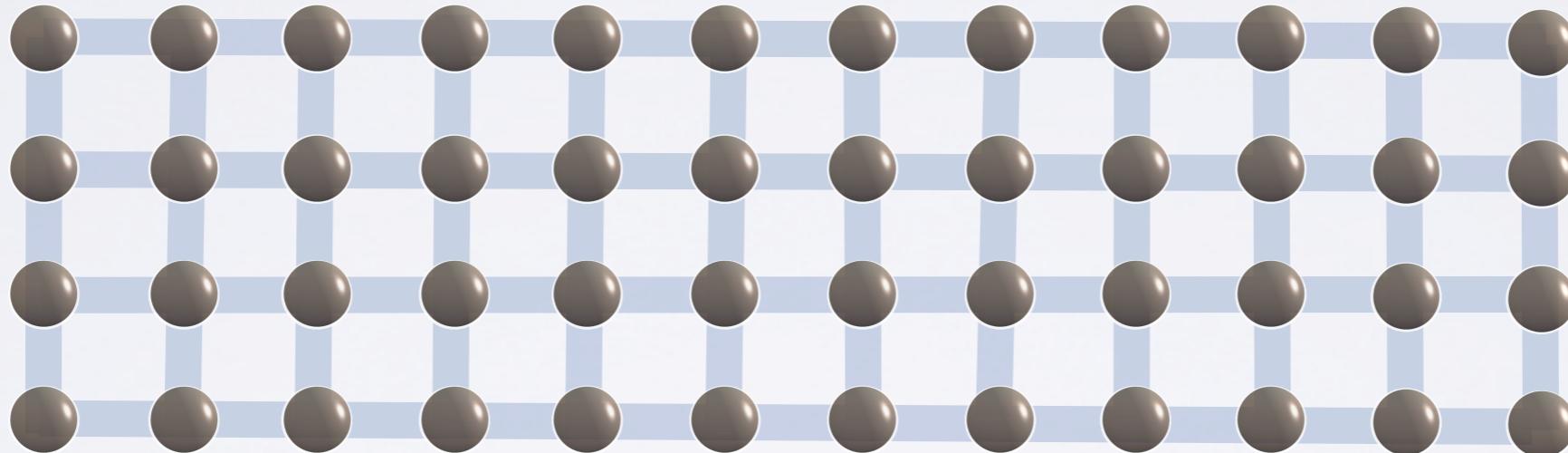
Truncated cluster expansion

$$\left\| \sum_{w \in C_{\geq L}(F)} \frac{(-\beta)^{|w|}}{|w!|} h(w) \right\|_1 \leq Z(\beta) \left(e^{|F| \frac{b(\beta)L}{1-b(\beta)}} - 1 \right)$$

Combinatorics

Physical implications: Bounds to Curie temperatures

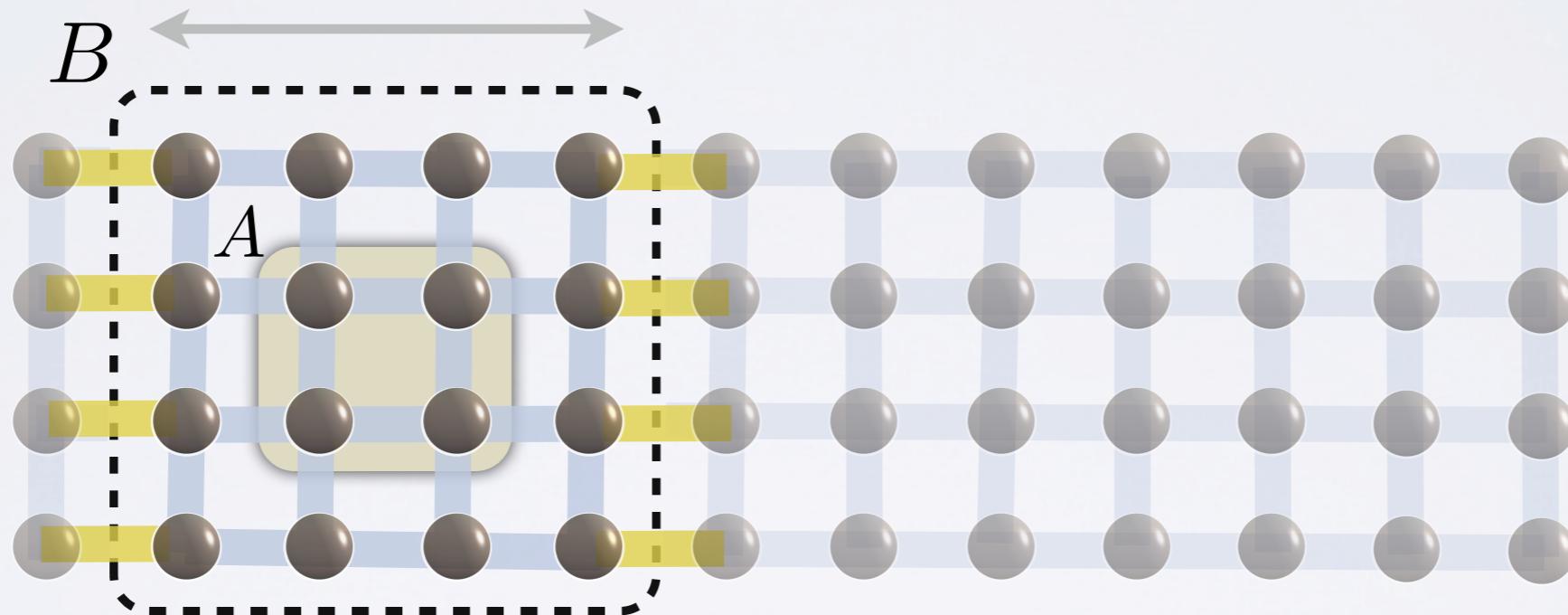
1. "Critical temperature" is **universal upper bound** to phase transition points



- E.g., ferromagnetic **2d isotropic Ising model** without external field,
 $1/(J\beta^*) = 24.58$, while phase transition known to happen at 2.27

Locality of temperature

2. Length scale of temperature

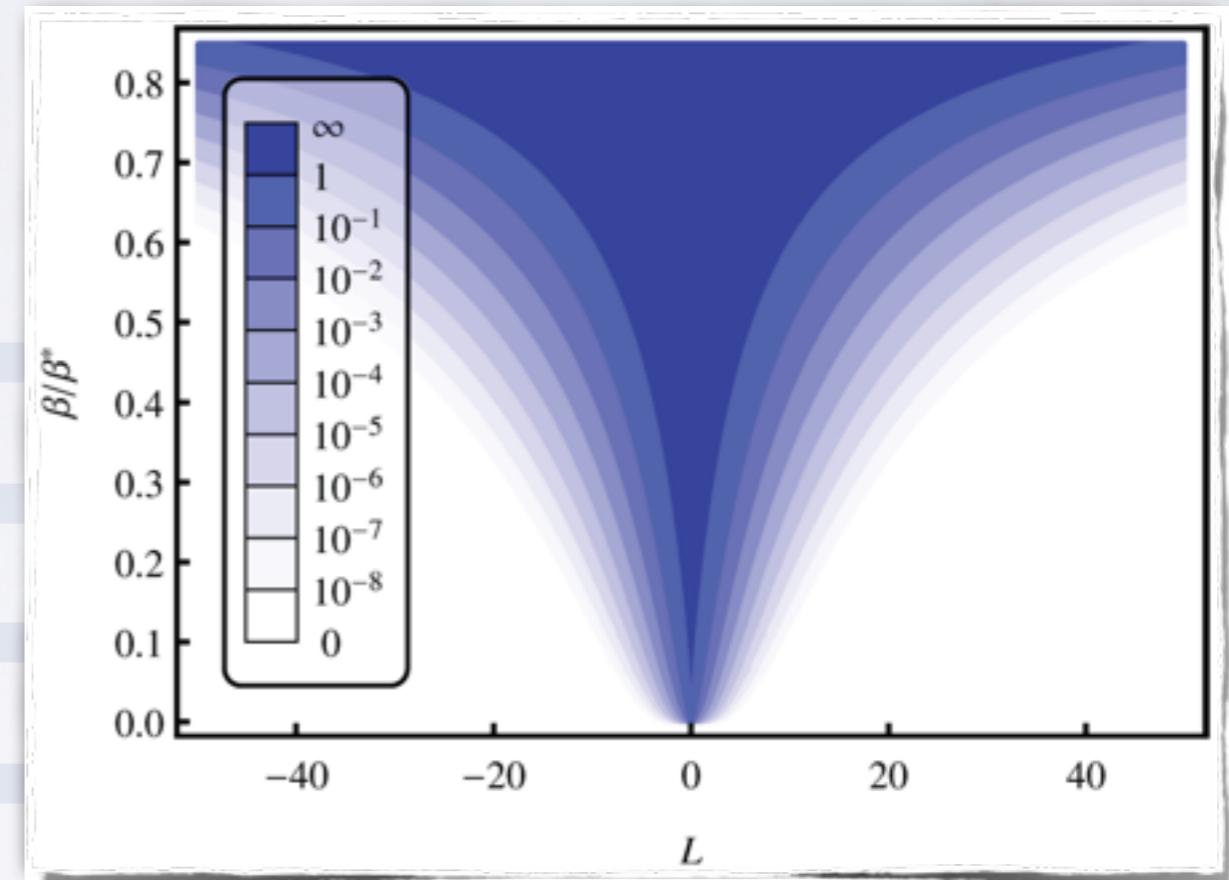
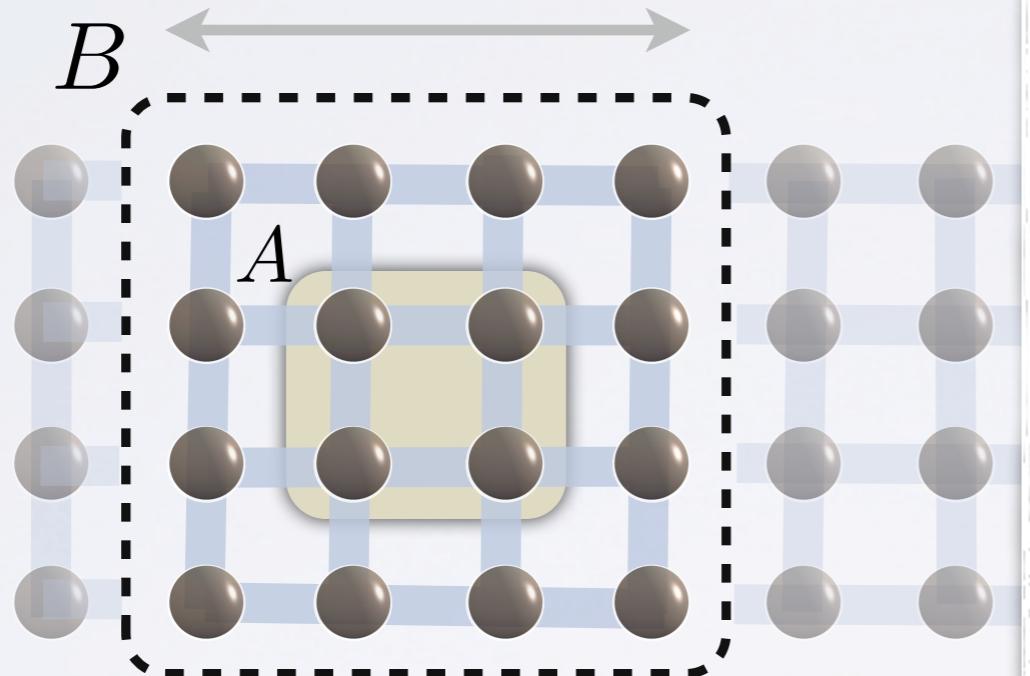


$$\text{tr}(Ag[H(0)]) - \text{tr}(Ag[H]) = \beta \int_0^1 d\tau \int_0^1 ds \text{Cov}_{g[H(s)]}^\tau(A, H_I)$$

$$H(s) = H - (1 - s)H_I$$

Locality of temperature

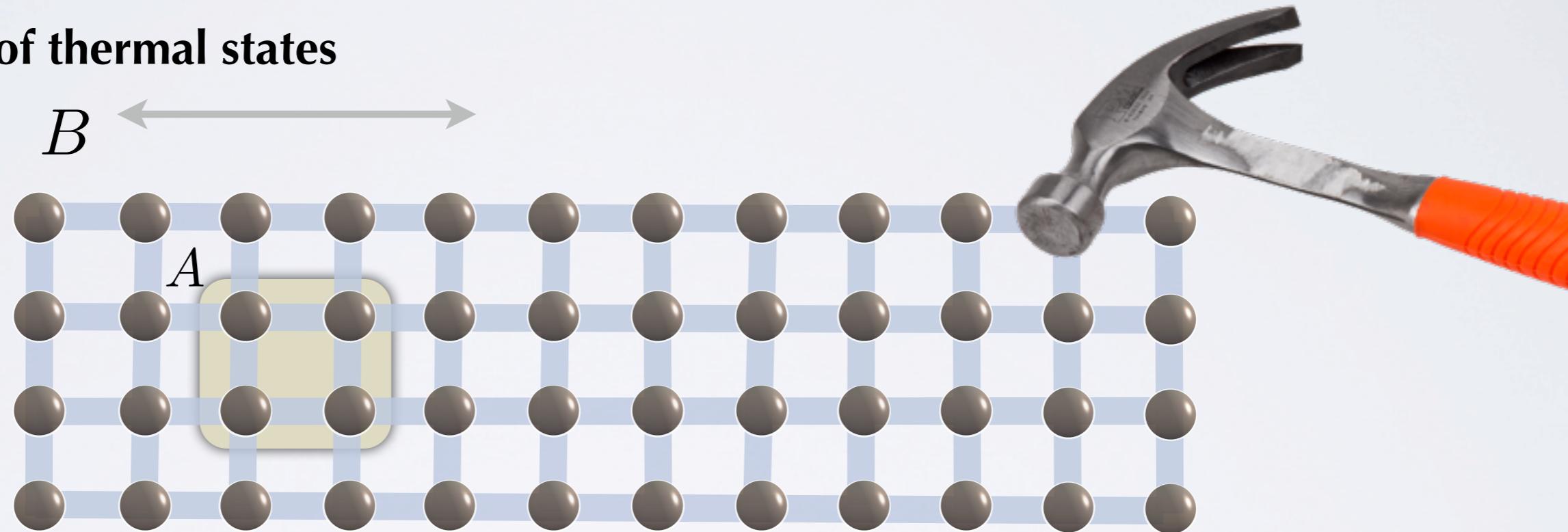
2. Length scale of temperature



$$\|g_A[H] - g_A[H(0)]\|_1 \leq \frac{v|\beta|J}{1 - e^{-1/\xi(\beta)}} e^{-d(A, \partial A)/\xi(\beta)}$$

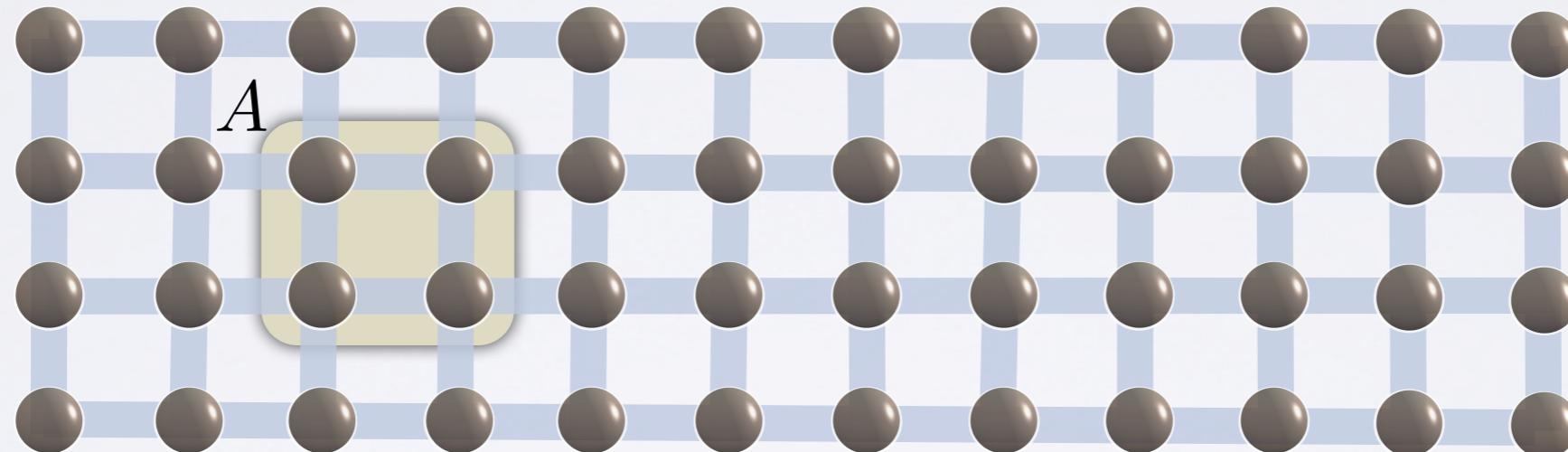
Stability of high temperature thermal states

3. Stability of thermal states



Efficient computation of expectation values

4. Local expectation can be **efficiently computed**

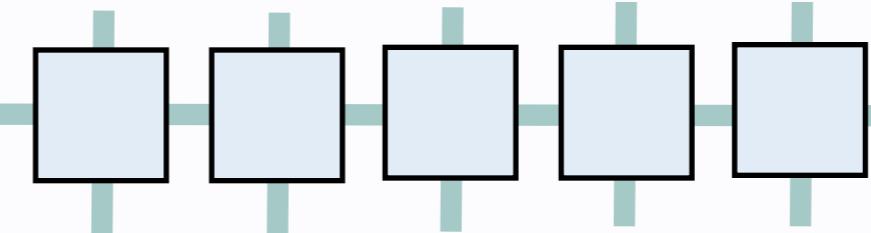


Tensor network state approximations

5. Matrix-product operator approximation



PEPO approximation of sub-exponential dimension, efficient **MPO** in 1D



Hastings, Phys Rev B 73, 085115 (2006)

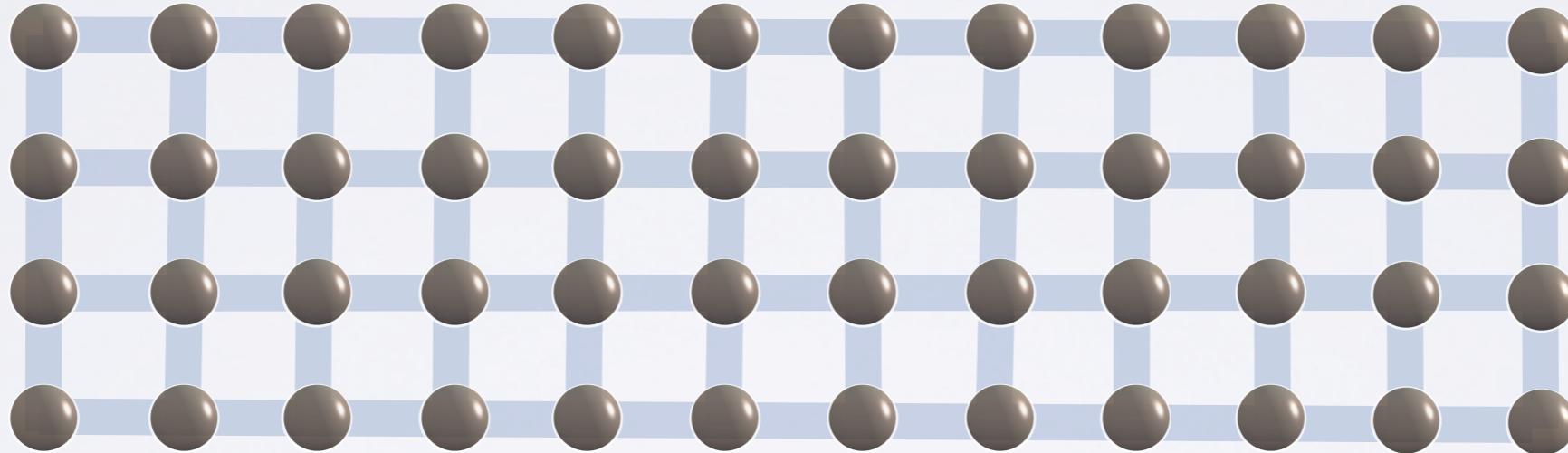
Kliesch, Gogolin, Kastoryano, Riera, Eisert, Phys Rev X 4, 031019 (2014)

- Exciting follow-up: PEPO approx for Gibbs states with bond dim $D = (N/\varepsilon)^{O(\beta)}$

Molnar, Schuch, Verstraete, Cirac, arXiv:1406.2973

Interacting fermions

6. All also true for interacting fermions



$$\{f_j, f_k^\dagger\} = \delta_{j,k}$$

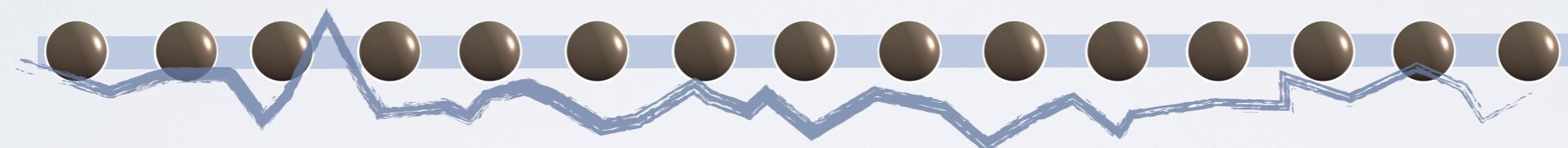
- Generalizing earlier results on fermionic covariance matrices (second moments)

Thermal many-body systems

- **Lessons:**
- **Length scale** at which one can speak of temperature
- High temperature thermal states have **clustering correlations**
- **Tensor network** approximations

Many-body localisation and matrix-product states

Anderson localisation



- **One particle** hopping on a line for an i.i.d. disordered Hamiltonian

$$H = \sum_j (|j\rangle\langle j+1| + |j+1\rangle\langle j|) + \sum_j f_j |j\rangle\langle j|$$

(or non-interacting particles)

- **Static reading:** 
- **Dynamical reading:**

- All eigenfunctions exponentially decaying correlations

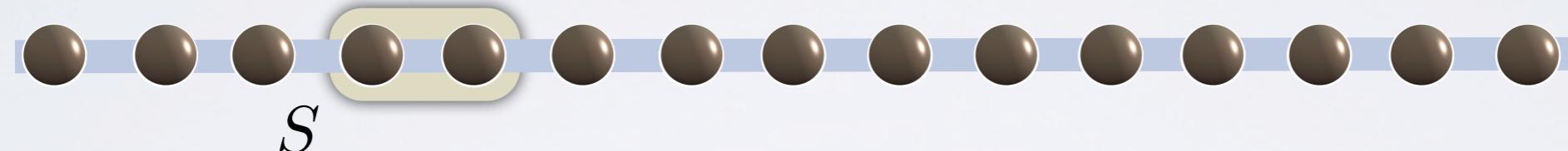
$$\mathbb{E}(\sup_t |\langle n | e^{-itH} | m \rangle|) \leq c_1 e^{-c_2 \text{dist}(n,m)}$$

Many-body localisation



- Does Anderson localisation survive finite **interactions**?
- Yes: **Many-body localisation (MBL)**
- Far from well-understood

Breakdown of eigenstate thermalisation



- Eigenstate thermalisation hypothesis (ETH):

Srednicki, Phys Rev E 50, 888 (1994)

- $\rho = |k\rangle\langle k|$
 $\rho_S = \text{tr}_B |k\rangle\langle k| \sim \text{tr}_B(e^{-\beta H})$

- System exhibits MBL if ETH breaks down

Pal, Huse, Phys Rev B 82, 174411 (2010)

Ogenesyan, Huse, Phys Rev B 75, 155111 (2007)

Gogolin, Mueller, Eisert, Phys Rev Lett 106, 040401 (2011)

Localisation in Fock space



- Anderson insulators with **perturbative interactions**

$$H = H_0 + \lambda H_{\text{int}}$$

- Solve single-particle problem, build Fock space of Slater dets
- Consider "localisation in Fock space"

Basko, Aleiner, Altshuler, Ann Phys 321, 1126 (2006)

Cognetti,

Static definition as MBL having MPS eigenstates



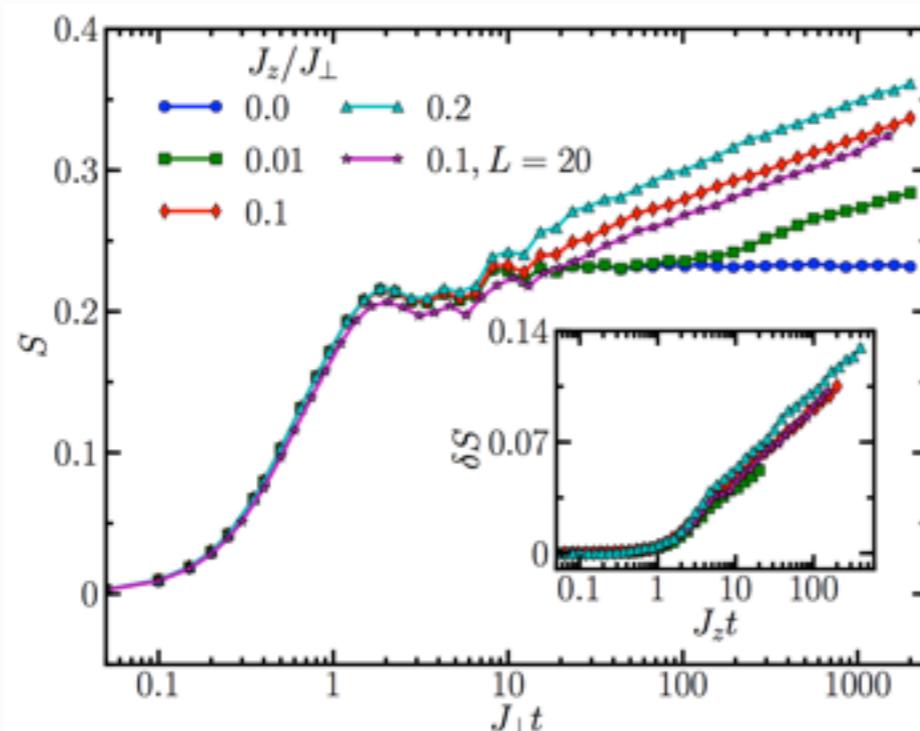
- More quantum information inspired
- MBL eigenstate ← → • Slater determinants
Finite depth circuit
- Most eigenstates are **matrix-product states** of low bond dimension

Bauer, Nayak, J Stat Mech P09005 (2013)

Entanglement entropy growth



- Slow entanglement entropy growth following quenches

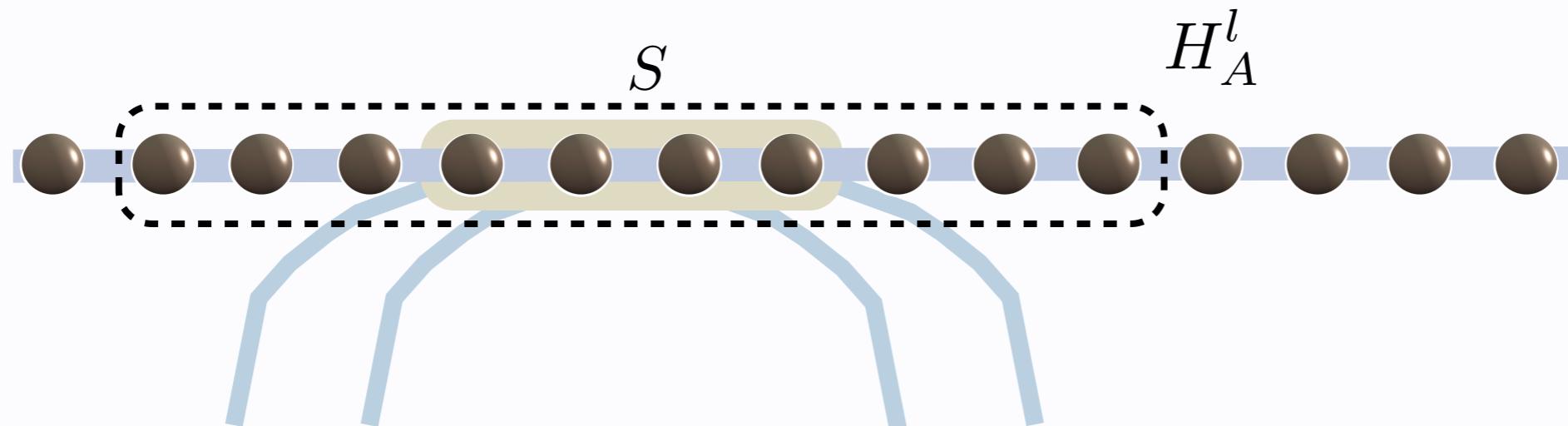


Badarson, Pollmann, Moore, Phys Rev Lett 109, 017202 (2012)

Dynamical localisation: Zero-velocity Lieb-Robinson bounds

- **Strong dynamical localisation:** All transport is blocked for arbitrary states

$$\|A(t) - e^{itH_A^l} A e^{-itH_A^l}\| \leq c_{\text{loc}} e^{-\mu l}$$

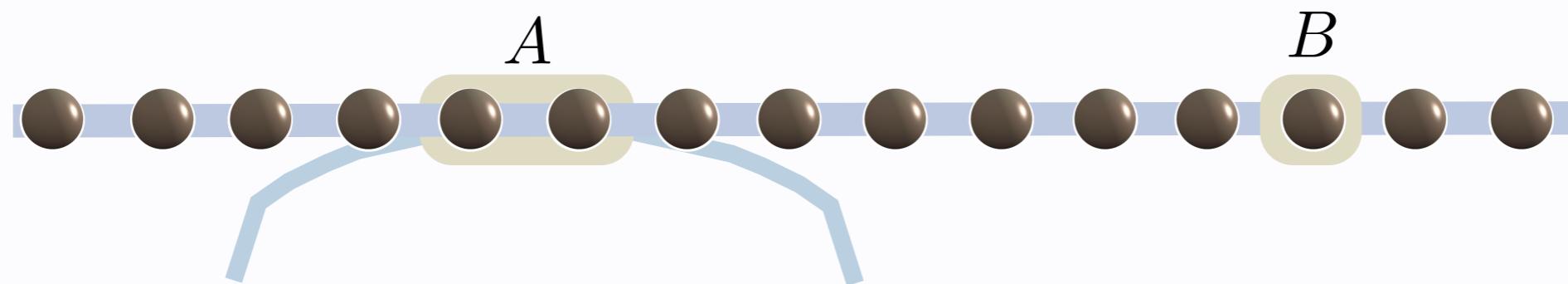


Dynamical localisation: Zero-velocity Lieb-Robinson bounds

- **Mobility edge:** Transport suppressed on the low-energy sector below E_{mob}

$\forall \rho \in \{|l\rangle\langle k| : E_l, E_k \leq E_{\text{mob}}\} :$

$$|\text{tr}(\rho[A(t), B])| \leq \min(t, 1) c_{\text{mob}} e^{-\mu d(A, B)}$$



- **Excitations get stuck:** Action of local unitaries not detectable far away

$$|\psi\rangle = U|0\rangle = e^{-iG}|0\rangle$$

$$|\langle 0|A(t)|0\rangle - \langle e|e^{iG}A(t)e^{-iG}|0\rangle| \leq \min(t, 1) \|G\| C e^{-\mu d(A, U)}$$

- **Numerical** evidence, say, for this for the Heisenberg model with disorder with exact diagonalisation, by us and others, see talk by Nicolas)

Cleaning up?

Can the dynamical picture and the static be related?



Main result: Dynamics \Rightarrow statics

- **Theorem** (clustering of correlations of eigenvectors)

a) If the Hamiltonian shows strong dynamical localisation then *all its eigenvectors* have exponentially clustering correlations

$$|\langle k|AB|k\rangle - \langle k|A|k\rangle\langle k|B|k\rangle| \leq 4c_{\text{loc}}e^{-\mu d(A,B)/2}$$

b) If the Hamiltonian has a mobility edge at energy, eigenstates below mob edge

$$\begin{aligned} & |\langle k|AB|k\rangle - \langle k|A|k\rangle\langle k|B|k\rangle| \\ & \leq \left(12\pi 2^N \mathcal{N}(E_k + \kappa) c_{\text{mob}} + \ln \frac{\pi \mu d(A, B) e^{4+2\pi}}{\kappa^2} \right) \frac{e^{-\mu d(A, B)/2}}{2\pi} \end{aligned}$$

where $\mathcal{N}(E)$ is normalized integrated density of states at energy E and $\kappa > 0$

Glimpse at proof

Dynamical localisation
with mobility edge

Use of filter functions $I_f^H(A) = \int_{-\infty}^{\infty} dt f(t) A(t)$

Partly diagonalizes observable in Hamiltonian basis

$$\langle k | I_f^H(A) | l \rangle = \hat{f}(E_k - E_l) \langle k | A | l \rangle$$

while still keeping some locality $\|I_f^H(A) - A_l\| \approx \int_{l/(2v)}^{\infty} dt |f(t)|$

Gaussian filter



High-pass filter



Cast correlation functions
into forms dependent
on commutator:
Use of Gaussian filters

Decompose spectrum
according to energies
 $\mathbb{I} = P + P^\perp$
then use high-pass filter

Clustering of correlations

Builds upon and generalised both
Hastings, Koma, Commun Math Phys 265, 119 (2006)
Hamsa, Sims, Stolz, Commun Math Phys 315, 215 (2012)

Glimpse at proof

Dynamical localisation
with mobility edge

Use of filter functions $I_f^H(A) = \int_{-\infty}^{\infty} dt f(t) A(t)$

Partly diagonalizes observable in Hamiltonian basis

$$\langle k | I_f^H(A) | l \rangle = \hat{f}(E_k - E_l) \langle k | A | l \rangle$$

while still keeping some locality $\|I_f^H(A) - A_l\| \approx \int_{l/(2v)}^{\infty} dt |f(t)|$

Gaussian filter



High-pass filter



Cast correlation functions
into forms dependent
on commutator:
Use of Gaussian filters

Decompose spectrum
according to energies
 $\mathbb{I} = P + P^\perp$
then use high-pass filter

Clustering of correlations

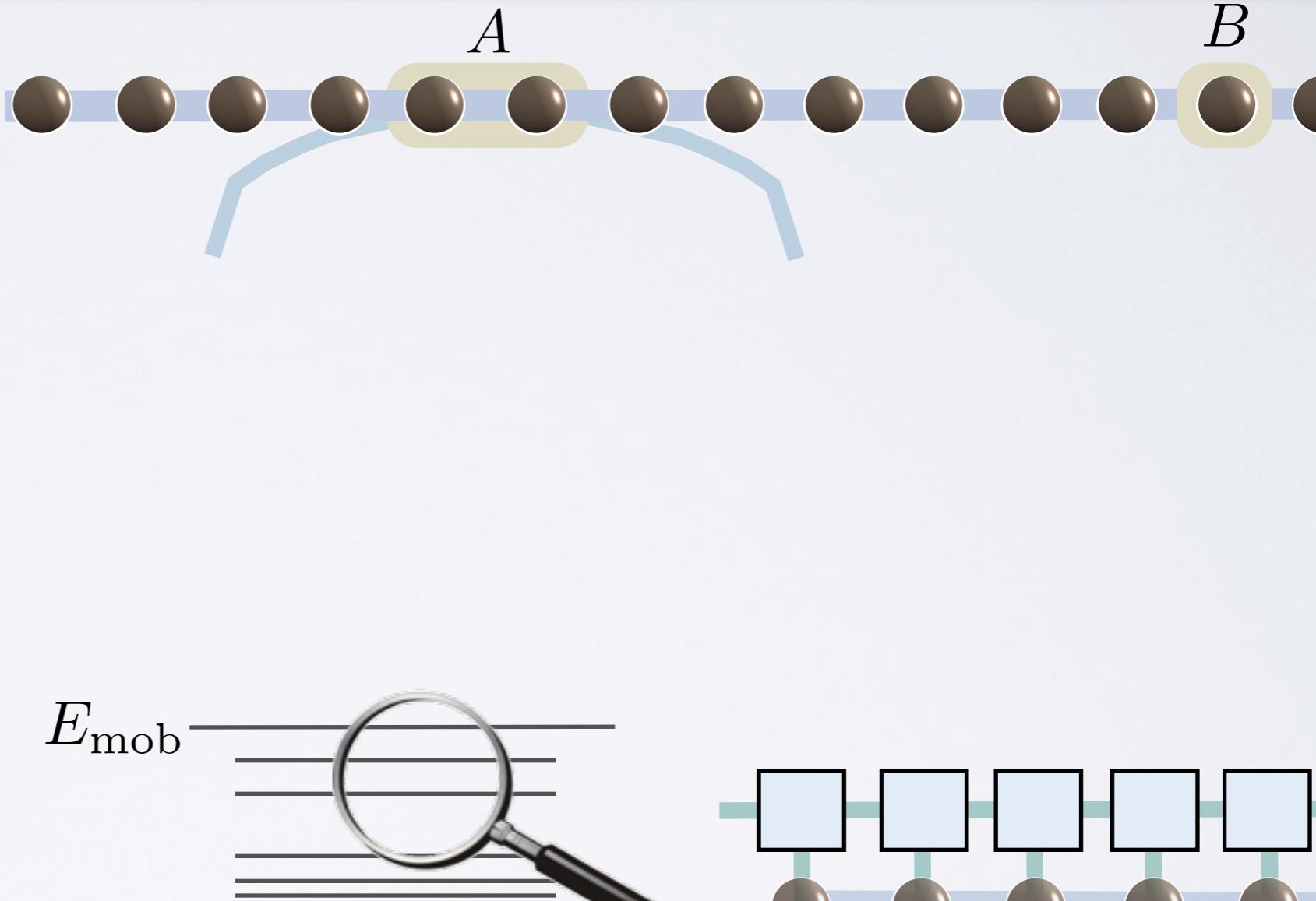
- All **eigenstates** below mobility edge well approximated by **MPS**

$$|\psi\rangle = \sum_{s_1, \dots, s_n} \text{tr}(A_{s_1} \dots A_{s_n}) |s_1, \dots, s_n\rangle, A \in \mathbb{C}^{D \times D}$$

with small bond dimension D , polynomial in system size

Matrix-product states from dynamical localisation

Dynamical localisation
with mobility edge

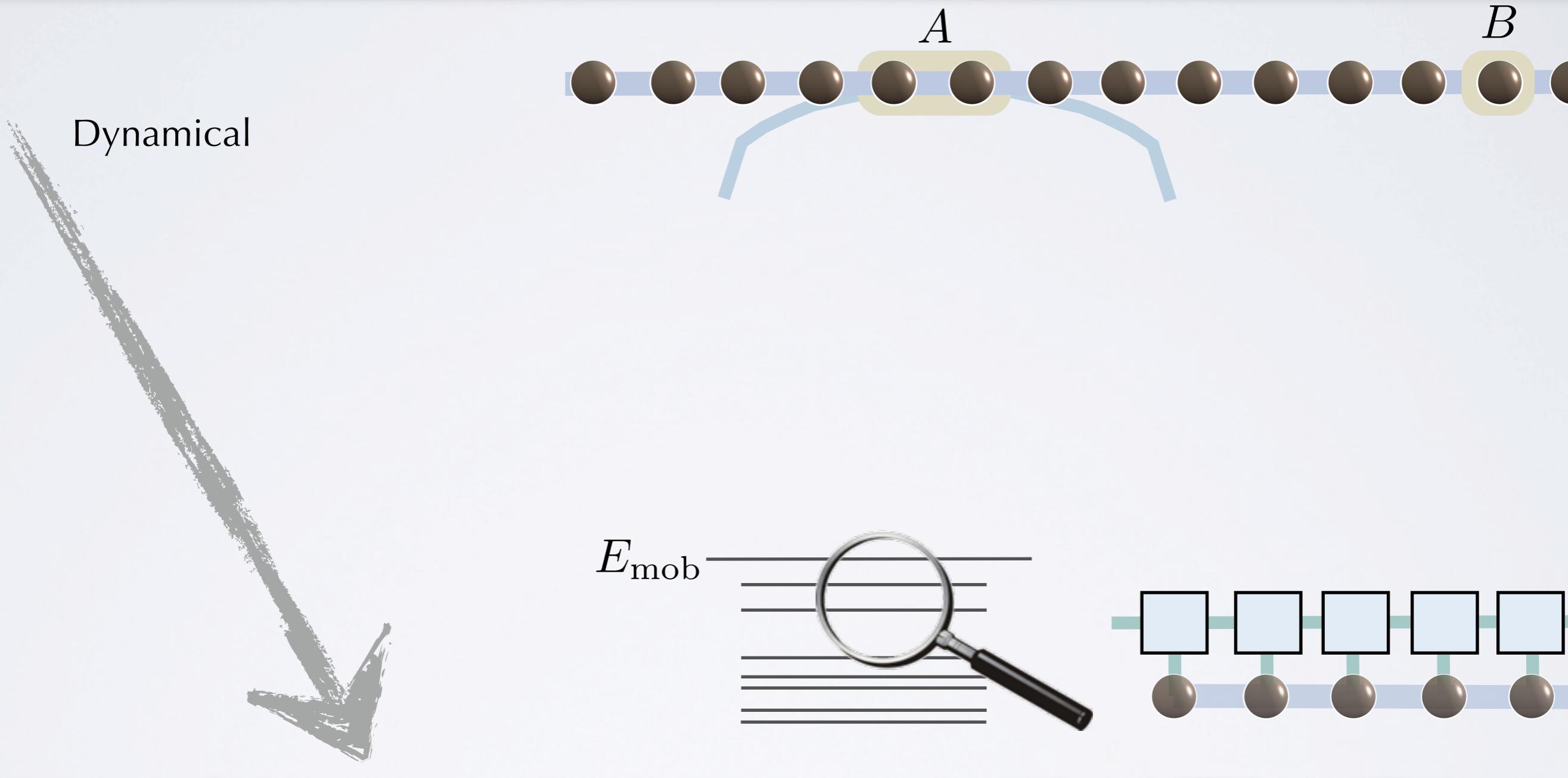


- All **eigenstates** below mobility edge well approximated by **MPS**

$$|\psi\rangle = \sum_{s_1, \dots, s_n} \text{tr}(A_{s_1} \dots A_{s_n}) |s_1, \dots, s_n\rangle, \quad A \in \mathbb{C}^{D \times D}$$

with small bond dimension D , polynomial in system size

Dynamical and static pictures



- **Lesson:**
- **Low energy eigenstates** (not only ground states) are **matrix-product states** of low bond dimension
- Bringing together definitions of **(many-body) localisation**

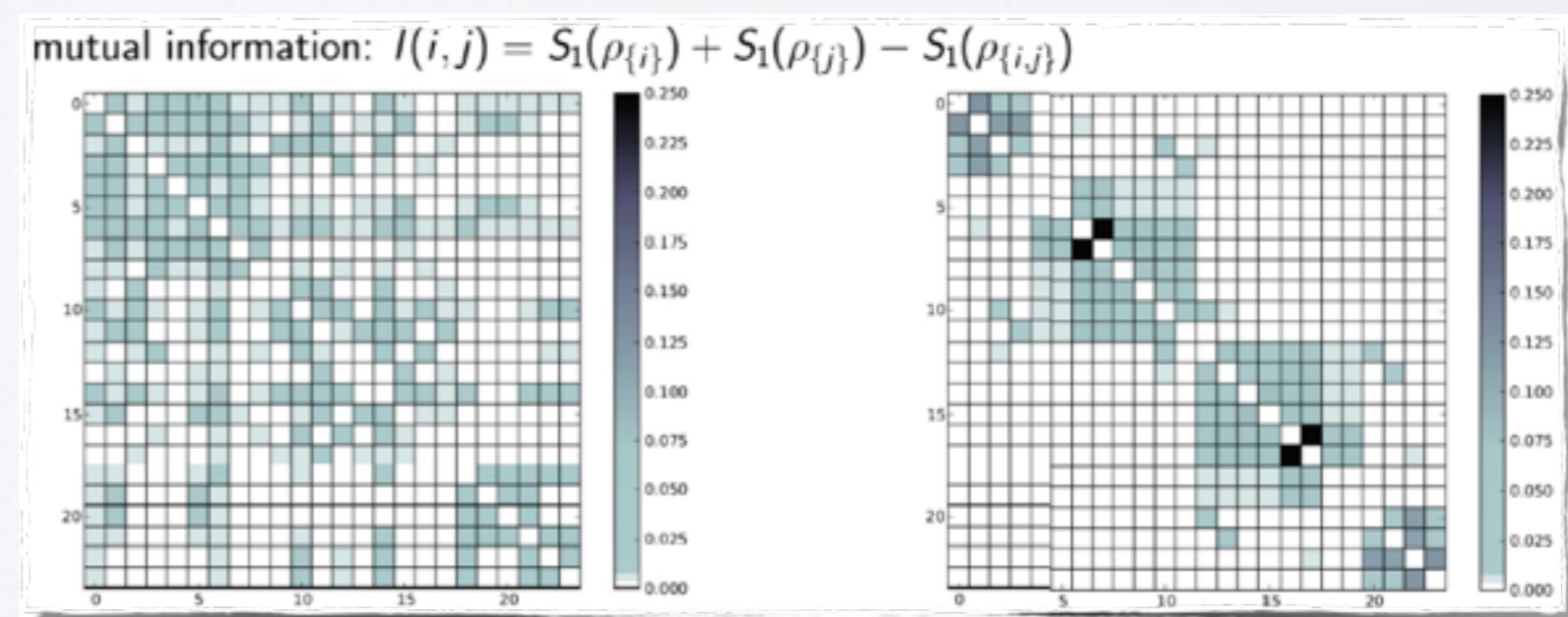
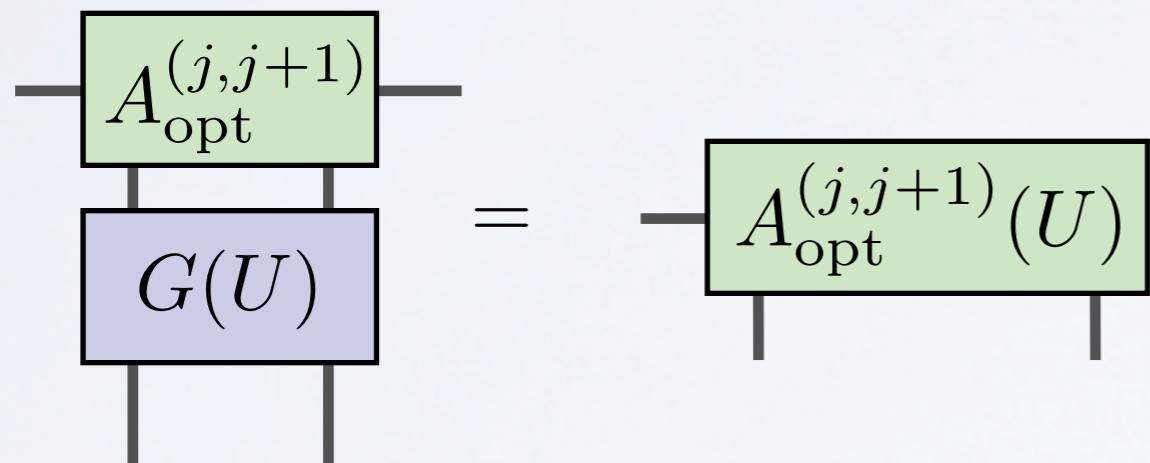
A teaser on posters

Tensor networks in quantum chemistry

- Interacting fermionic **problems in quantum chemistry**

$$H = \sum_{i,j} T_{i,j} c_i^\dagger c_j + \sum_{i,j,k,l} c_i^\dagger c_j^\dagger c_k c_l \quad (c_1, \dots, c_n)$$

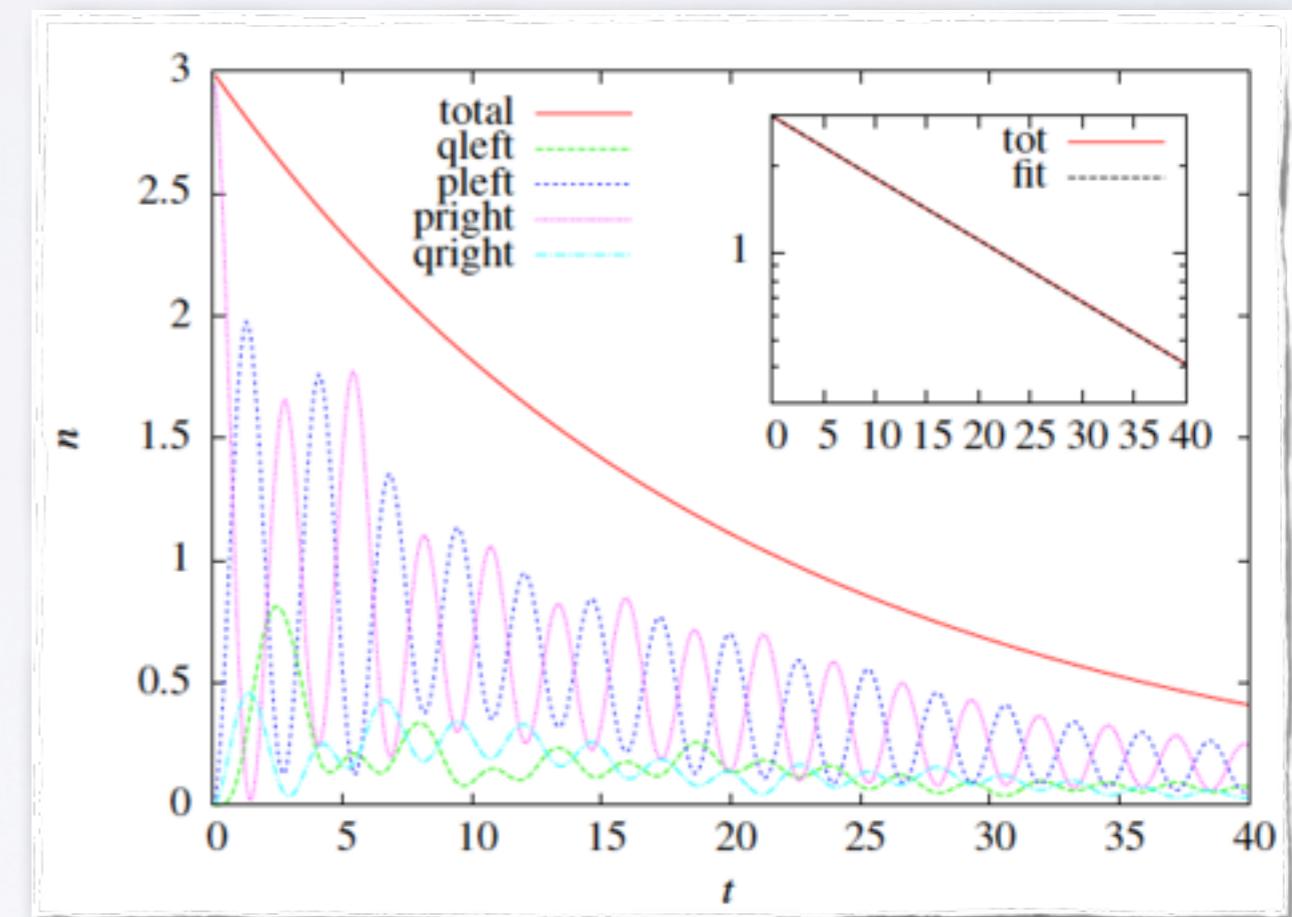
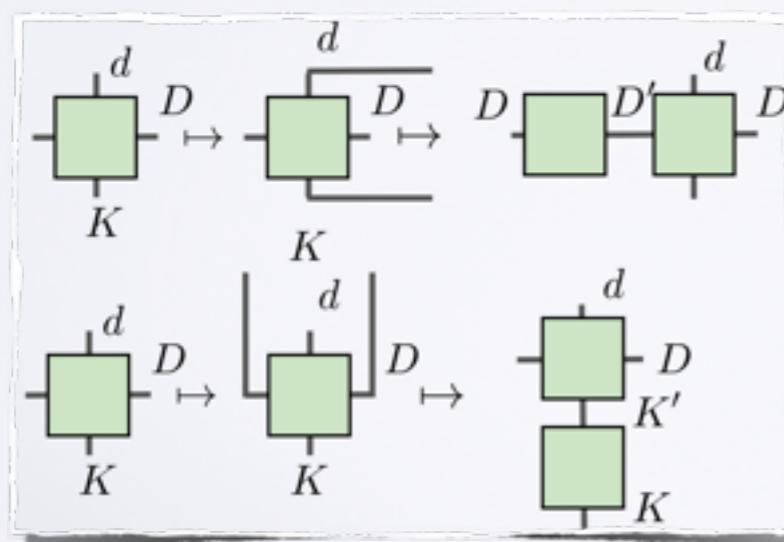
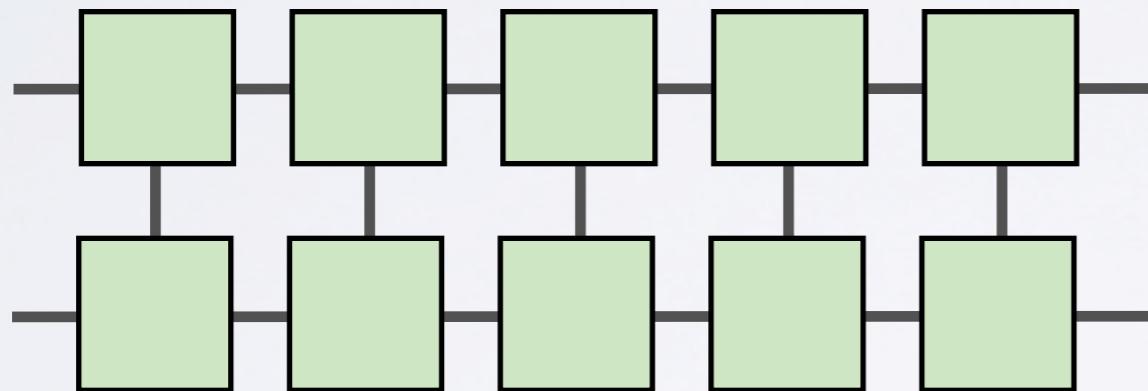
- Adaptive mode transformations: Combine MPS with local fermionic mode updates
 $(c_1, \dots, c_n) \mapsto (c'_1, \dots, c'_n)$



Positive tensor network approach for open quantum systems

- **Open systems simulation** with locally purified MPOs

$$\mathcal{L}(\rho) = -i \sum_j [h_j, \rho] + \sum_j \left(L_j \rho L_j^\dagger - \frac{1}{2} \{ L_j^\dagger L_j, \rho \} \right)$$



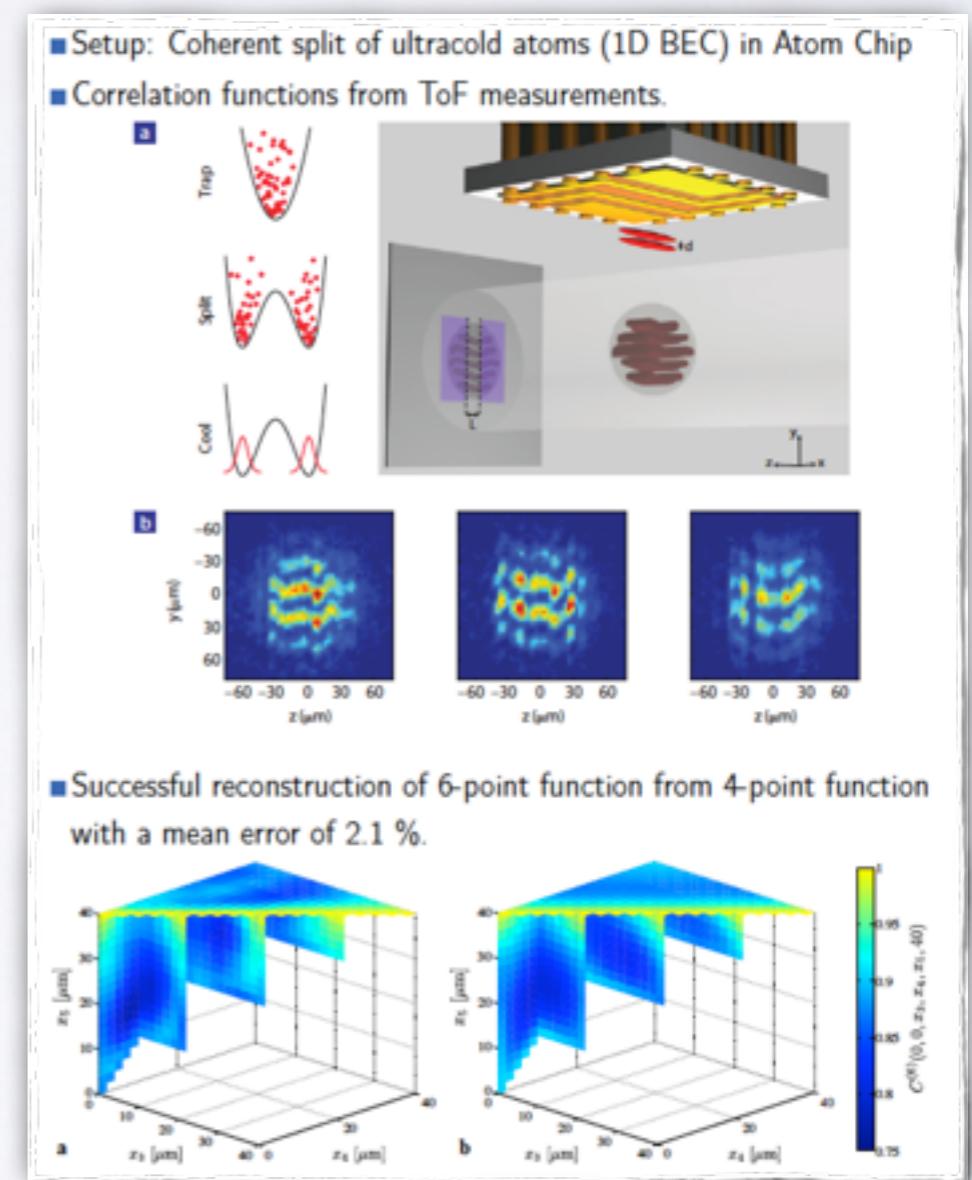
Quantum field tomography and continuous MPS

- Simulations with **continuous matrix product states**

$$|\psi\rangle = \text{tr}(\mathcal{P} e^{\int_0^L dx(Q \otimes 1) + R \otimes \Psi^\dagger(x)}) |\Omega\rangle, \quad [\Psi(y), \Psi^\dagger(x)] = \delta(x - y)$$

- **Quantum field tomography:** Reconstruct cMPS based on correlation functions

- Apply to **experiments** with cold atoms



Summary

Ground states

All quantum states

"Physical corner" of
state space described
by tensor network
states

High temperature
thermal states

Many-body localised states

Thanks for your attention!