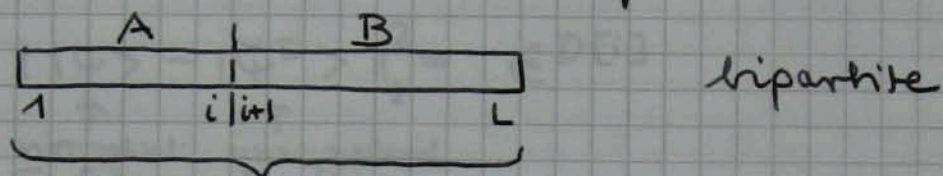


# DMRG - A QUANTUM INFORMATION PERSPECTIVE

1. MPS-approximability of quantum statics
2. MPS-approximability of quantum dynamics

Reconsider Schmidt decomposition:  $AB \rightarrow A + B$

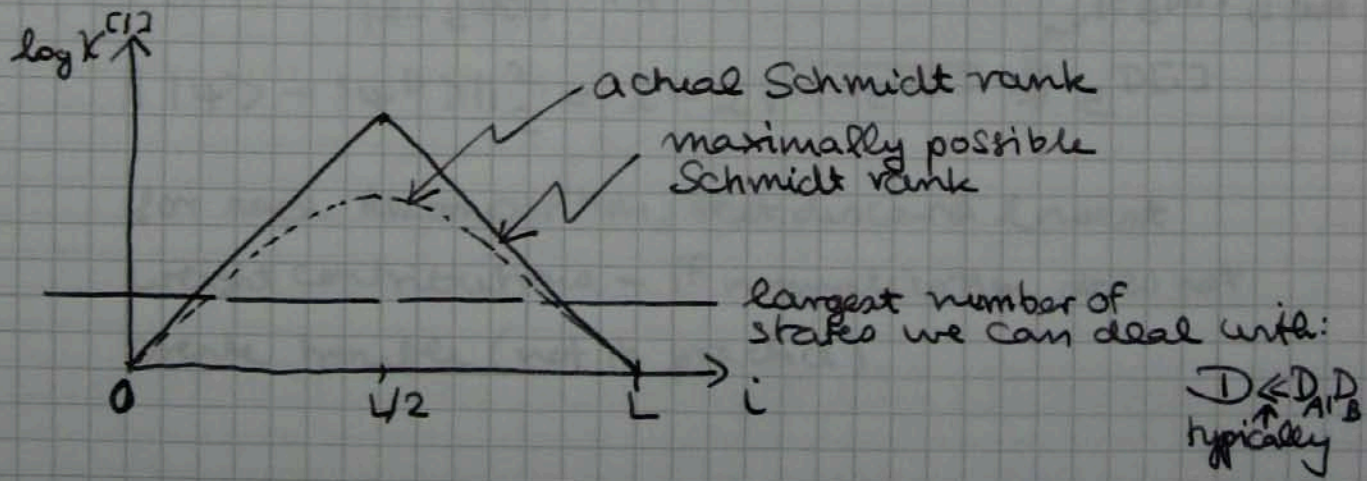


$$|\psi\rangle = \sum_{i_A, j_B} \psi_{ij} \underbrace{|i\rangle_A}_{\text{ONB's in A}} \underbrace{|j\rangle_B}_{\text{ONB's in B}} \rightarrow$$

$$|\psi\rangle = \sum_{m^{[i]}=1}^{\min(D_A, D_B)} \underbrace{\sqrt{w_m^{[i]}}}_{\geq 0} \underbrace{|m\rangle_A}_{\text{can be completed to ONB's in A}} \underbrace{|m\rangle_B}_{\text{can be completed to ONB's in B}}$$

Schmidt rank  $\chi^{[i]}$ : # of  $\sqrt{w_m^{[i]}} > 0$

$$\chi^{[i]} \leq \min(D_A, D_B) = \min(d^i, d^{L-i})$$



best approximation?

assume decreasing order:  $w_1^{[i]} \geq w_2^{[i]} \geq \dots$   
in all of following!

Easy calculation shows: best approx. by

$$|\tilde{\psi}^D\rangle = \sum_{m=1}^D \underbrace{\sqrt{w_m^{[i]}}}_{\text{keep the largest eigen Schmidt coefficients}} |m_A^{[i]}\rangle |m_B^{[i]}\rangle$$

how good is the approximation?

$$\| |\psi\rangle - |\tilde{\psi}^D\rangle \|_2^2 = \epsilon^{D[i]}$$

$\uparrow$  normalized:  $\sum w_m^{[i]} = 1$        $\uparrow$  unnormalized:  $\sum w_m^{[i]} \leq 1$

with truncation error

$$\epsilon^{D[i]} = 1 - \sum_{m=1}^D w_m^{[i]} = \underbrace{\sum_{m=D+1}^{\min(D_A, D_B)} w_m^{[i]}}_{\text{discarded statistical weight}}$$

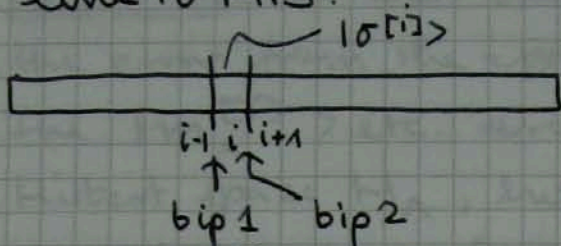
normalized approximation:

$$|\psi^D\rangle = \frac{1}{\sqrt{1 - \epsilon^{D[i]}}} |\tilde{\psi}^D\rangle$$

$$\| |\psi\rangle - |\psi^D\rangle \|_2^2 = 2 - 2\sqrt{1 - \epsilon^{D[i]}} \approx \epsilon^{D[i]} \quad \leftarrow \text{if } \epsilon^{D[i]} \text{ is small}$$

for each decomposition, best discard lowest weight contributions - if normalization does not create trouble (not in practice)

link to MPS:



$$|\psi\rangle = \sum_m \sqrt{w_m^{[i-1]}} |m_A^{[i-1]}\rangle |m_B^{[i-1]}\rangle \quad (\text{bip 1})$$

$$= \sum_m \sqrt{w_m^{[i]}} |m_A^{[i]}\rangle |m_B^{[i]}\rangle \quad (\text{bip 2})$$

$$|m_A^{[i]}\rangle = \sum \underbrace{\langle m_A^{[i]} \sigma^{[i]} | m_A^{[i]} \rangle}_{=: (A^{\sigma^{[i]}})_{m_A^{[i-1]}, m_A^{[i]}}} |m_A^{[i-1]}\rangle |\sigma^{[i]}\rangle$$

$\Rightarrow$  defines recursively a MPS

$$|\psi\rangle = \sum_{\{\sigma^{[i]}\}} A^{\sigma^{[1]}} A^{\sigma^{[2]}} \dots A^{\sigma^{[L]}} \underbrace{\psi^{[i]} \tilde{A}^{\sigma^{[i+1]}} \dots \tilde{A}^{\sigma^{[L]}}}_{\substack{\uparrow \\ \text{diagonal} \\ \text{with entries} \\ \sqrt{w_m^{[i]}}} \times |\sigma^{[1]}\rangle \dots \sigma^{[L]}\rangle$$

$A, \tilde{A}$ : grow from left, right; different normalization conditions

$$\sum_{\sigma} A^{[\sigma]} \dagger A^{[\sigma]} = \mathbb{1} \quad \text{vs.}$$

$$\sum_{\sigma} \tilde{A}^{[\sigma]} \tilde{A}^{[\sigma] \dagger} = \mathbb{1} \quad \text{from ON}$$

position of  $i$  can be shifted freely, to obtain

$$|\psi\rangle_{\text{MPS}} = \sum_{\sigma^{[i]}} A^{\sigma^{[1]}} \dots A^{\sigma^{[L]}} |\sigma^{[1]}\rangle \dots \sigma^{[L]}\rangle$$

dimension upto  $(D \times D)$

$(1 \times d) (d \times d^2) \dots (d^i \times D) (D \times D) \dots (D \times d^i) \dots (d^2 \times d) (d \times 1)$   
for OBC.

important: at each decomposition, we know the error from the approximation - but the  $|m_A^{[i]}\rangle$  etc. are not from entire Hilbert space  $H_A$ , but themselves from a restricted subset because of construction!

$$\begin{aligned}
 & \circ \left| \langle \hat{O} \rangle_{|\psi\rangle} - \langle \hat{O} \rangle_{|\psi_{MPS}^D\rangle} \right| & \|\hat{O}\|_{\text{op}} &= \sup_{|\psi\rangle \in H} \frac{\langle \psi | \hat{O} | \psi \rangle}{\langle \psi | \psi \rangle} \\
 & = \left| \text{tr}(\hat{\psi} \hat{O}) - \text{tr}(\hat{\psi}_{MPS}^D \hat{O}) \right| & (\hat{\psi} &= |\psi\rangle\langle\psi|, \dots) \\
 & = \left| \sum_i \langle i | \hat{\psi} - \hat{\psi}_{MPS}^D | i \rangle \langle i | \hat{O} | i \rangle \right| & |i\rangle &: \text{eig. basis of } (\hat{\psi} - \hat{\psi}_{MPS}^D) \\
 & \leq \|\hat{O}\|_{\text{op}} \sum_i |\langle i | \hat{\psi} - \hat{\psi}_{MPS}^D | i \rangle| \\
 & = 2 \|\hat{O}\|_{\text{op}} T(\hat{\psi}, \hat{\psi}_{MPS}^D) \leftarrow \begin{matrix} \text{trace distance:} \\ T(\hat{\rho}, \hat{\sigma}) = \frac{1}{2} \text{tr} |\hat{\rho} - \hat{\sigma}| \\ |\hat{\sigma}| = \sqrt{\hat{\sigma}^2} \end{matrix} \\
 & \circ \left\| |\psi\rangle - |\psi_{MPS}^D\rangle \right\|_2^2 = 2 - 2F(|\psi\rangle, |\psi_{MPS}^D\rangle) \\
 & \quad \leftarrow \text{fidelity } F(\hat{\rho}, \hat{\sigma}) = \text{tr} \sqrt{\hat{\rho}^{\frac{1}{2}} \hat{\sigma} \hat{\rho}^{\frac{1}{2}}} \\
 & \quad \quad = |\langle \psi | \psi \rangle| \\
 & \quad \quad \quad \leftarrow \text{for pure states}
 \end{aligned}$$

Theorems:

worst-case approximation (for optimal choice) upper bound

$$\left\| |\psi\rangle - |\psi_{MPS}^D\rangle \right\|_2^2 \leq 2 \sum_{i=1}^{L-1} \epsilon D[i]$$

best-case approximation (for optimal choice) lower bound

$$T(\hat{\psi}, \hat{\psi}_{MPS}^D) \geq \frac{1}{2} \max_i \epsilon D[i]$$

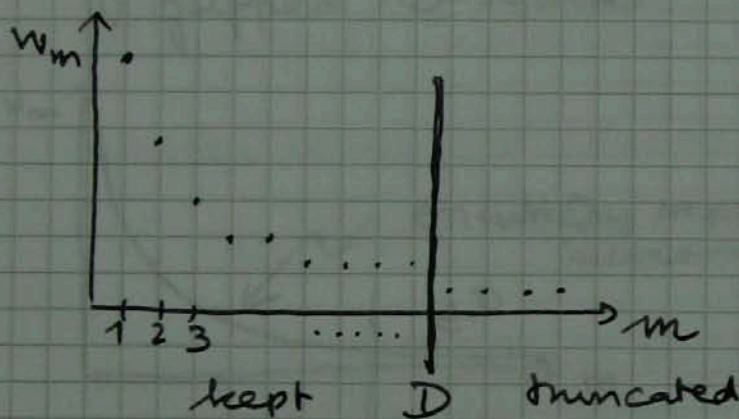
The theorems confirm the intuitive result that approximation quality is linked to the truncation error.

↓

property of reduced density operator spectra!

$$| \psi \rangle \rightarrow \sum_m \sqrt{w_m} | m_A \rangle | m_B \rangle \rightarrow$$

$$\left. \begin{aligned} \hat{\rho}_A &= \sum w_m | m_A \rangle \langle m_A | \\ \hat{\rho}_B &= \sum w_m | m_B \rangle \langle m_B | \end{aligned} \right\} \text{share spectra}$$

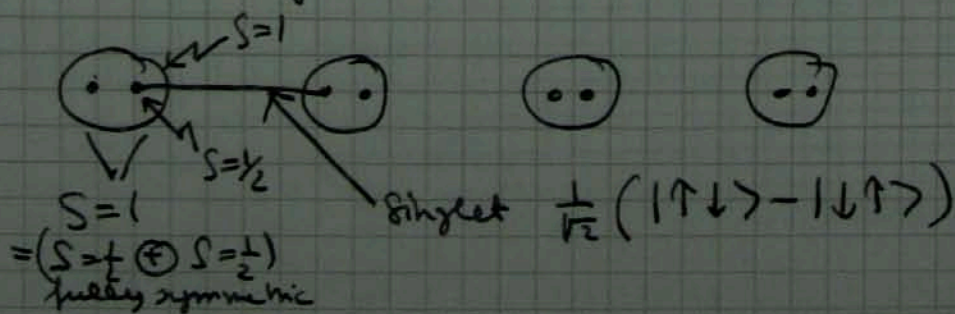


⇒ simulability by MPS will depend on

what do they look like for "real" quantum states (ground states of Hamiltonians that occur in nature)?

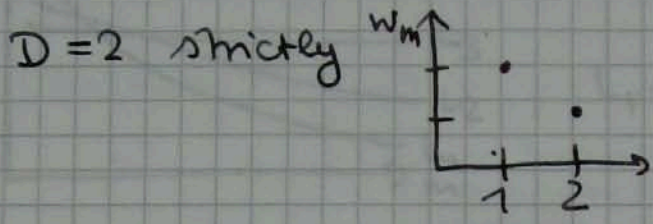
i) MPS

example:  $H = \sum \vec{S}_i \cdot \vec{S}_{i+1} + \frac{1}{3} (\vec{S}_i \cdot \vec{S}_{i+1})^2$  ( $S=1$ )  
has AKLT-ground state



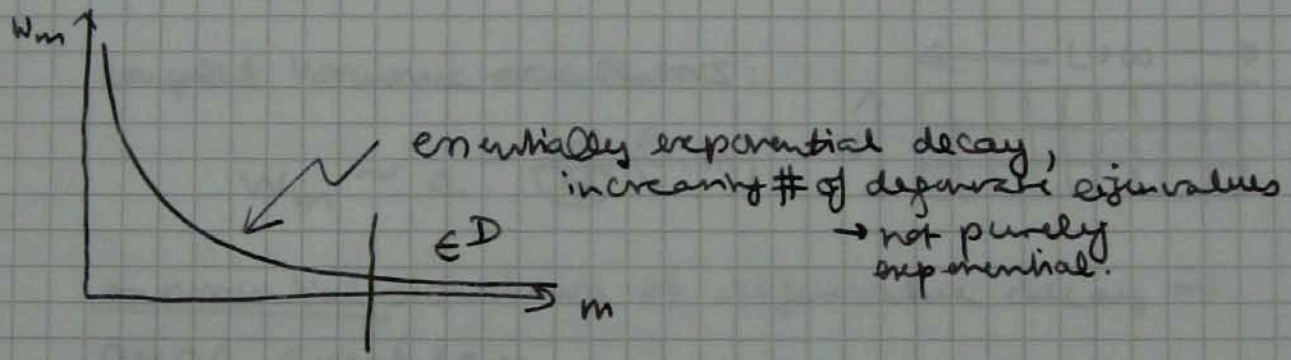
can be expressed as MPS via:

$$A^+ = \begin{bmatrix} 0 & \sqrt{\frac{2}{3}} \\ 0 & 0 \end{bmatrix} \quad A^0 = \begin{bmatrix} -\frac{1}{3} & 0 \\ 0 & \frac{1}{3} \end{bmatrix} \quad A^- = \begin{bmatrix} 0 & 0 \\ -\sqrt{\frac{2}{3}} & 0 \end{bmatrix}$$



but this is rare!

ii) gapped 1D-systems



some exact results:

- transverse Ising
- XXZ Heisenberg  $S=1/2$  in AFM gapped regime

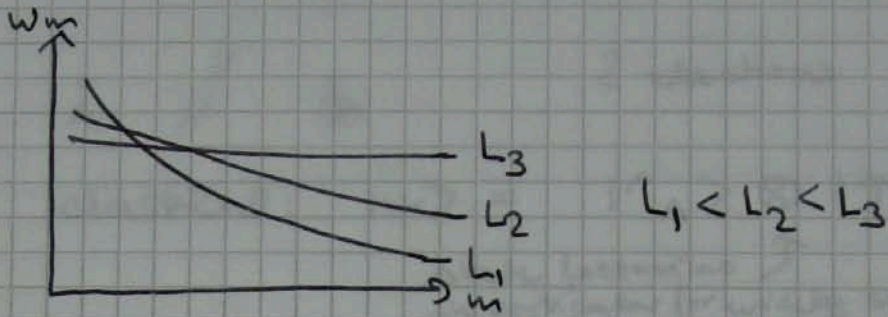
$$E_D = e^{-\frac{3|\ln 2|}{\pi^2} (\ln D)^2}$$

depends on interaction parameter

quite generally:

$$w_m \sim e^{-\text{const.} (\ln m)^2}$$

## iii) critical 1D systems

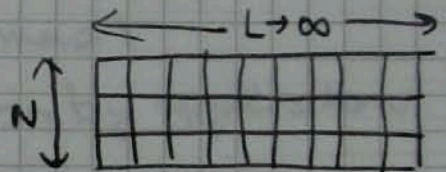


spectrum becomes flatter with  $L \Rightarrow$   
discarded weight grows!

## iv) gapped 2D systems

coupled harmonic oscillators:

$$w_m \sim e^{-\frac{\text{const.}}{N} (\ln m)^2}$$



exponential slowdown of eigenvalue decay  $\Rightarrow$   
DMRG breakdown

can we understand these results generically  
and perhaps without looking at individual  
spectra?

# Entanglement and area law



classical:  $|\psi\rangle = |\uparrow_A\rangle \otimes |\uparrow_B\rangle$  or similarly

state factorizes  $\uparrow$   
in particular for widely separated particles  
separability

quantum:  $|\psi\rangle = \frac{1}{\sqrt{2}} [|\uparrow_A \downarrow_B\rangle + |\downarrow_A \uparrow_B\rangle]$

superposition + tensor structure

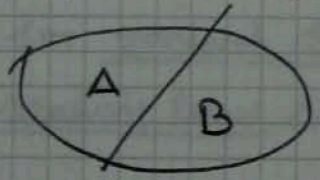
state does not factorize,  
entangled (here even maximally entangled)

how do we quantify entanglement?

numerous options, often driven by application

for pure states we focus on  
entanglement entropy

$$|\psi\rangle = \sum \psi_{ij} |i\rangle_A |j\rangle_B \quad \begin{cases} \hat{\rho}_A = \text{tr}_B \hat{\rho} \\ \hat{\rho}_B = \text{tr}_A \hat{\rho} \end{cases} \quad \begin{array}{l} \text{reduced} \\ \text{density} \\ \text{operators} \end{array}$$



$$\hat{\rho} = |\psi\rangle\langle\psi| \Rightarrow$$

$$(\hat{\rho}_A)_{ii'} = \sum_j \psi_{ij} \psi_{ij}^* |i\rangle_A \langle i'|_A$$

$$= \sum w_m |m_A\rangle \langle m_A|$$

$\uparrow$  Schmidt decomp. gives eigen representation!

$$S(|\psi\rangle)_{A/B} := S_{VN}(\hat{\rho}_A) = S_{VN}(\hat{\rho}_B)$$

$\uparrow$  ent. entropy       $\uparrow$  for pure states only!  
 $\uparrow$  von Neumann entropy       $\uparrow$  same spectrum!



where  $S_{VN}(\hat{\rho}) = -\text{tr} \hat{\rho} \log_2 \hat{\rho}$   
 $= -\sum W_m \log_2 W_m.$

proxy quantity for (decisive) spectra!

How does  $S_{VN}(\hat{\rho}_A)$  depend on system size?

thermal entropy is extensive

$|\psi\rangle = \sum_m \sqrt{W_m} |m_A\rangle |m_B\rangle$  generic quantum state in Schmidt form.

↑  
can be imagined like random numbers

$S_{VN}(\hat{\rho}_A) = -\sum_m W_m \log_2 W_m = O(V)$

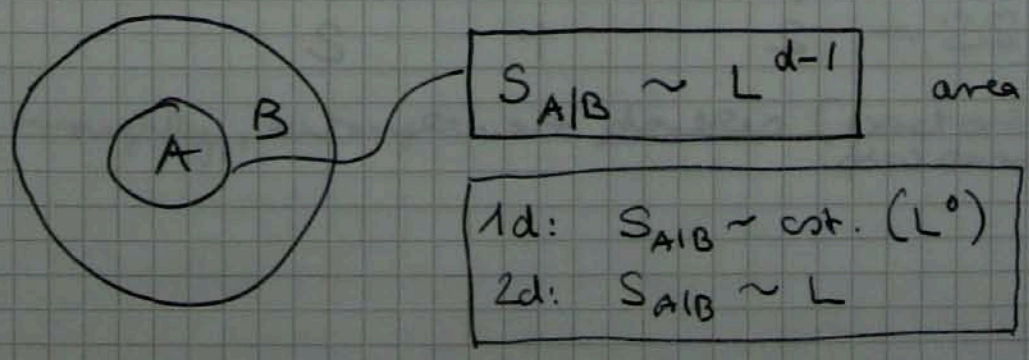
| |  
 $O(\frac{1}{d^V})$  |  $O(\frac{1}{d^V})$

extensive for generic states!

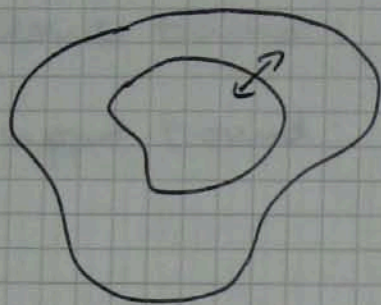
**BUT**

for ground states (low energy states) <sup>of short ranged Hamiltonians</sup> a different scaling law seems to hold (no global proof):

AREA LAW: entanglement entropy scales as the surface of the subsystem, i.e. the boundary



black hole physics: Bekenstein, Hawking (1974)



short-ranged correlations generate entanglement  $\rightarrow$

entanglement  $\propto$  surface

(for gapped systems)

corrections for critical systems ( $\xi = \infty$ )

$$S_{A|B}(L) = \left( \frac{c}{3} \log_2 L + k \right) \quad (1D)$$

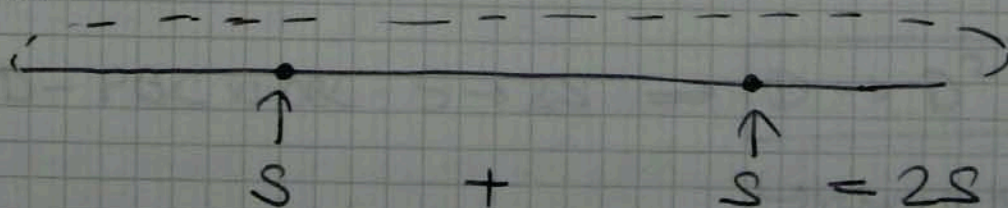
central charge of corresponding conformal field theory

(typically small, e.g. 0.5 or 1)

in 2D more complicated:

- log. correction for fermions with 1D Fermi surface
- sublog. correction for fermions with 0D Fermi surface
- no correction for bosons.

special case: periodic boundary conditions in 1D:



roughly, entanglement doubles (exact only in few cases)

von Neumann entropy and spectra:

lower bound:  $\{1, 0, 0, 0, \dots\} \rightarrow S_{VN}(\hat{\rho}) = 0$

upper bound:  $\{\underbrace{\frac{1}{D}, \frac{1}{D}, \dots}_{D \text{ of them completely mixed spectrum}}\} \rightarrow S_{VN}(\hat{\rho}) = \log_2 D.$

(provable by majorization theorems)

handwaving argument:

for  $D$  states, max. entanglement  $\log_2 D \implies$   
for entanglement  $S$ , minimally  $2^{2S}$  states  
(but depends on problem!)

$$D \sim 2^S \rightarrow D(L) \sim 2^{S(L)}$$

1D-gapped:  $D \sim 2^{S(L)} \sim 2^{cst} \sim \underline{cst.} \quad \checkmark$

1D-critical  $D \sim 2^{S(L)} \sim 2^{\frac{2}{3} \log_2 L} \sim L^{2/3} \sim$

This is why DMRG works so well in 1D!  
thermodyn. limit not reachable, but good enough for scaling!

1D-PBC vs. OBC:  $S \rightarrow 2S \implies \boxed{D \rightarrow D^2}$

↳ return to that!

2D-gapped:  $D \sim 2^{S(L)} \sim 2^L \quad \text{☹️}$

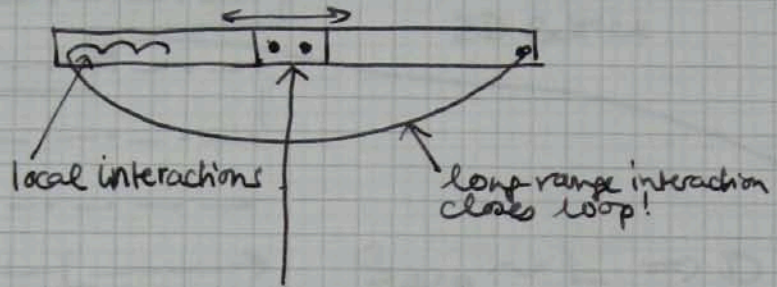
2D-critical, 3D-gapped } even worse  $\text{☹️}$

This is why DMRG fails in 2D and 3D!

What can we do against it?

① periodic boundary conditions

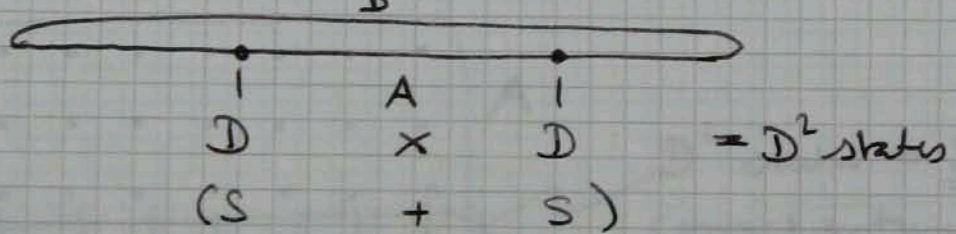
in traditional DMRG:



cut here:  $D^2$  states vs.  $D \Rightarrow$   
 $D^6$  time vs.  $D^3$  time  
 (worst case!!!)

or generalize MPS:

$$|\psi\rangle = \sum_{\{\sigma_i\}} \text{tr} \left( \underset{D \times D}{A^{\sigma[1]}} \dots \underset{D \times D}{A^{\sigma[L]}} \right) |\sigma_1 \dots \sigma_L\rangle$$



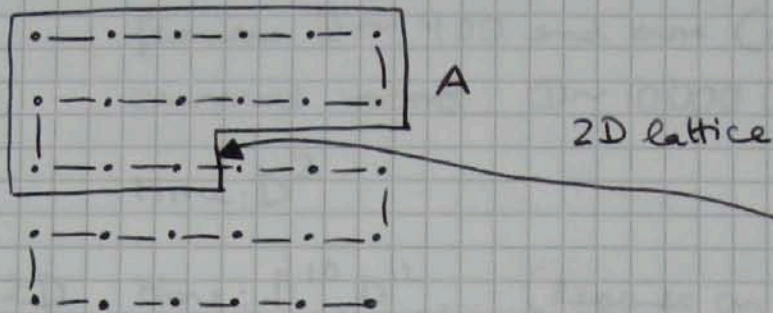
natural form for PBC!

- drawback:
- $D^5$  time
  - numerically less pleasant

recent improvement to  $D^3$  time with minimal approx. (Pippan et al.)

② higher-dimensional systems

in traditional DMRG:

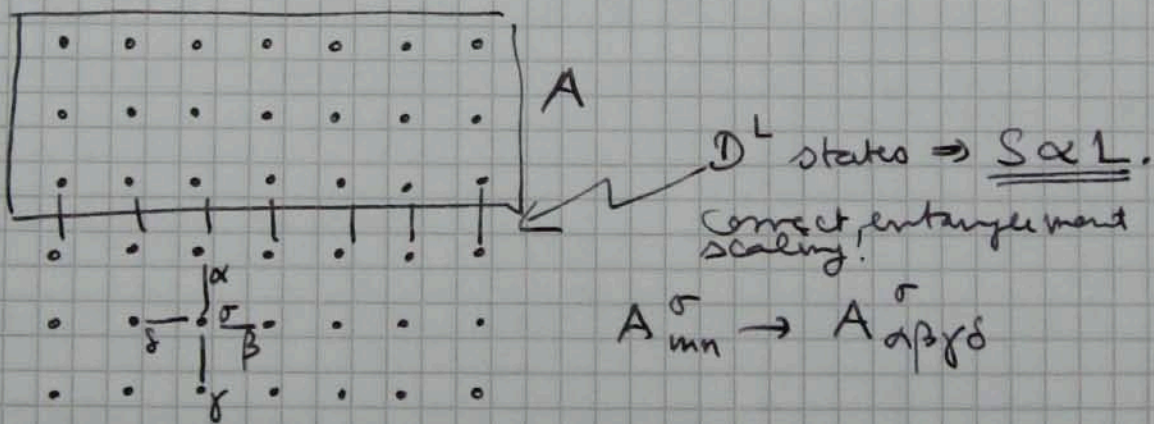


$S_{A/B} \sim L \Rightarrow D \gtrsim 2^L$

same "trick" as for PBC: can we distribute  $D \sim 2^L$ ?

MPS: A matrix:  $\begin{matrix} & \sigma & \\ m & | & n \\ & A_{mn} & \end{matrix}$  indices correspond to neighbors!

generalize to PEPS (Projected Entangled Pair States)



$|\psi\rangle = \sum_{\sigma} \text{contr}(A^1, A^2, A^3, \dots, A^L) |\sigma_1 \dots \sigma_L\rangle$

Contract over all indices

How to do that efficiently?

CURRENT TOPIC!

Why can we have hope that such algorithms work?

1D: bosons  $D \sim 100$ , fermions  $D \sim 200$ ,  
 fermions  $D \sim 400$  and more (critical systems!)  
 current record:  $D \sim 10000$  (needed for dynamics)

time:  $D^3$

2D time:  $D^{10}, D^{12}, \dots$  (depends on incarnation of algorithm)

Why is there hope?

problems become more mean-field with increasing dimension:  $[D \rightarrow 1] \Rightarrow$  so we expect much smaller  $D$  in 2D than in 1D!

2. Simulation of dynamics

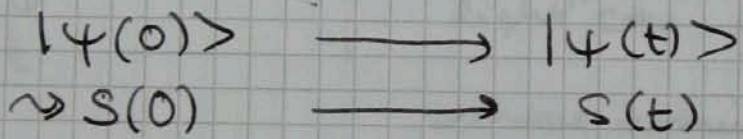
How far can we go with time-dependent DMRG?

1. evolving the state: error  $O(\Delta t^5) \times \frac{I}{\Delta t} \sim T \cdot \Delta t^4$   
 in Trotter,  
 even smaller in Krylov.
2. finding the optimal approximation: error  $O(\epsilon^D)$   
 truncation error.

At first sight: very long time dynamics with moderately growing error.

THIS IS - IN GENERAL - NOT THE CASE!

entanglement dynamics

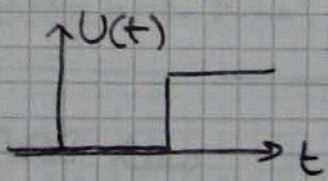


in general,  $S(t)$  will be quite different from  $S(0)$ !

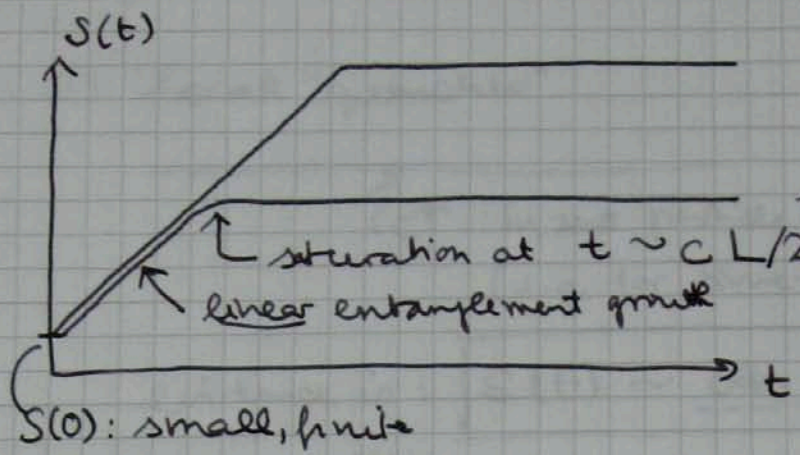
i) global quenches

$$H = -J \sum_i (b_i^\dagger b_{i+1} + h.c.) + U(t) \sum_i n_i (n_i - 1) / 2$$

Bose-Hubbard model (cold atoms)



- energy changes macroscopically  $\propto L$
- $|\psi\rangle$  ground state  $\rightarrow$  highly excited state



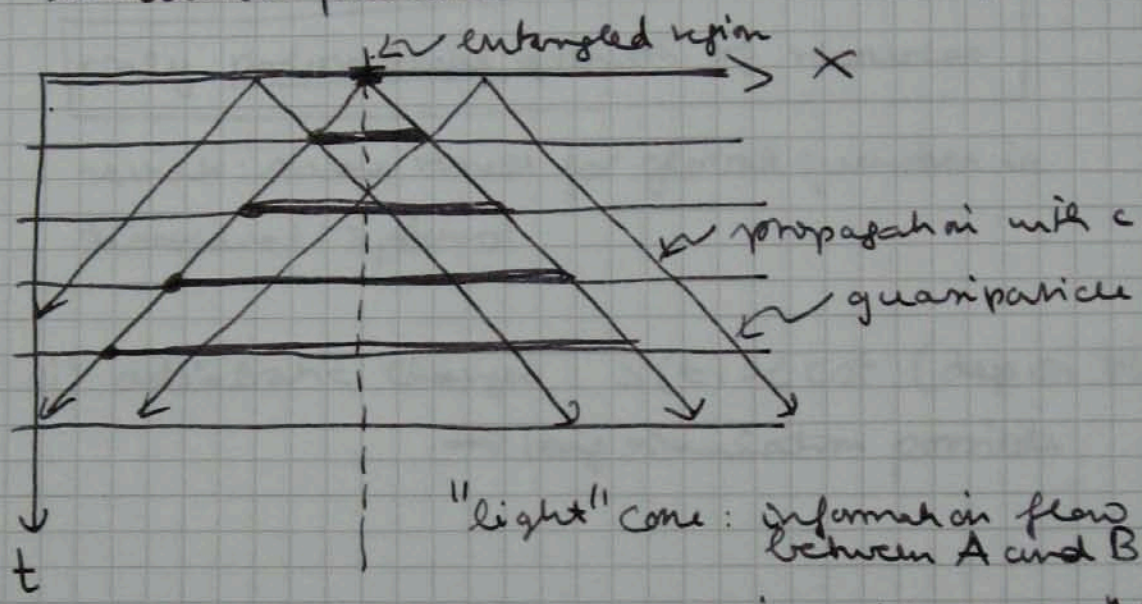
$L_2$   
 $\checkmark$   
 system length  $L_1$   
 $c$  is typical propagation speed in system

$S(0)$ : small, finite

$$S = cst \cdot t + S_0$$

up to saturation

intuitive picture:



"light" cone: information flow between A and B

assume certain entanglement "stored" per length unit

$$D(t) \sim 2^{S(t)} \Rightarrow D(t) \sim 2^t$$

matrix dimension grows exponentially with time!

key limitation of time-dependent DRG lies in nature of quantum state!



ii) local "quenches"

$\uparrow c_i^t$  : insert particle at time  $t$   
(e.g. for time-dependent correlators!)

evidence is:  $S(t) \sim \underline{cst. \log t}$  up to saturation.

$$\Rightarrow D(t) \sim 2^{S(t)} \rightarrow D(t) \sim t^{cst.}$$

only polynomial growth of resources.

remark: same result for global quenches in disordered systems!

iii) adiabatic changes:  $S(t) \propto cst.$  (depend on  $H(t)$ )  
 $\rightarrow$  long simulation possible