

# Efficient Algorithm for Ground State of 1D Hamiltonians

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[Feynman '81] Exponential description of quantum states poses challenge to classical simulation.

.....  
n particles } Classical:  $O(n)$  parameters.  
                  } Quantum:  $2^{O(n)}$  parameters.

Use a quantum computer.

What do we do until we have quantum computers?

Numerical techniques have been remarkably successful in practice for 1D systems:

- Good Ansatz for Ground state: MPS
- DMRG algorithm[White '92] very successful for 1D
- Doesn't always work. Artificial hard examples known.

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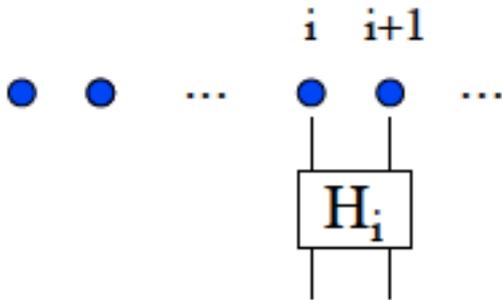
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1. Is there a theoretical justification?

Are 1D systems easy?

2. 2D systems?

# 1D Ground States



$$H = H_1 + \dots + H_m$$

- Qudits
- Each  $H_i$  is  $d^2 \times d^2$ , positive, norm  $\leq 1$
- Wish to compute ground state  $|GS\rangle$ , state that minimizes energy  $E = \langle GS|H|GS\rangle$
- Given the  $H_i$  as input (to some precision), calculate a classical description of  $|GS\rangle$  (to some precision). The classical description must allow efficient evaluation of local observables.

# Matrix Product States (MPS)



$$|\psi\rangle = \sum_{i=1}^B |A_i\rangle \otimes |B_i\rangle$$

Bond dimension = Schmidt rank across cut

# Quantum Complexity Theory Perspective

[Kitaev '99]:

Introduction of QMA – quantum analogue of NP.

Finding ground states of general local Hamiltonians is QMA complete.

Conjecture: no sub-exponential size classical witness for QMA-complete problems.

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[Aharonov, Gottesman, Irani, Kempe 07]

QMA-complete for 1D Hamiltonians

[Gottesman, Irani 09] Hard even for translation invariant 1D Hamiltonians

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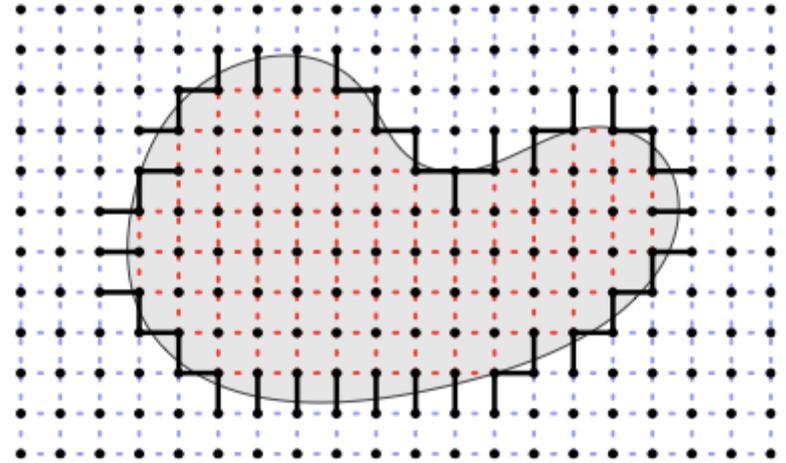
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# Area Law

For gapped local Hamiltonians  $H = H_1 + \dots + H_m$ , entanglement entropy of the ground state scales like surface area, rather than volume.



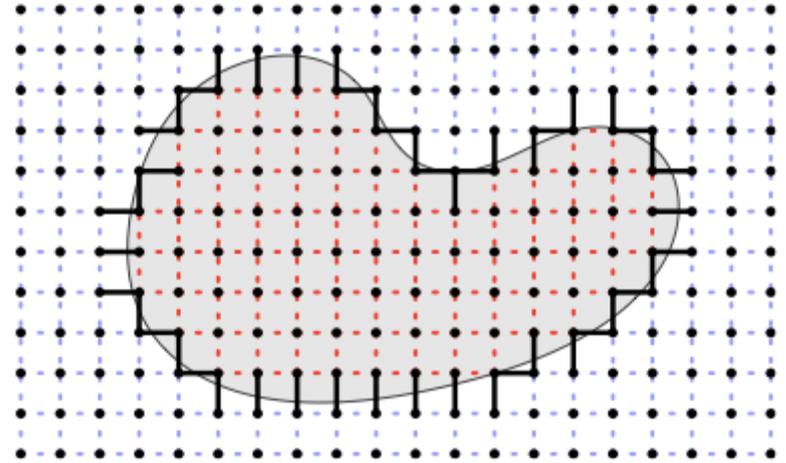
Gapped local Hamiltonians

spectral gap =  $\varepsilon = E_1 - E_0 = \text{constant}$ .

$$|H_i| \leq 1$$

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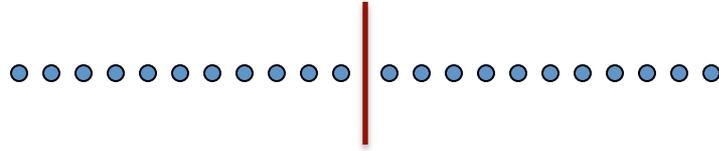
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Related to Holographic Principle: Black hole entropy scales like surface area.

[Vidal, Latorre, Rico, Kitaev '02]

# 1D Area Law



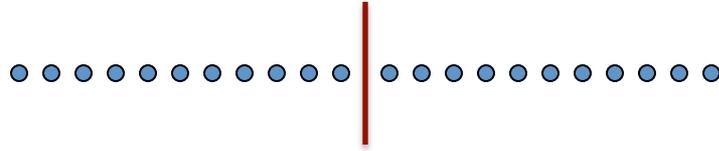
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$$S_{1D} = O(\exp(\log d / \varepsilon))$$

$d$  = dimension of particle,  $\varepsilon$  = spectral gap.

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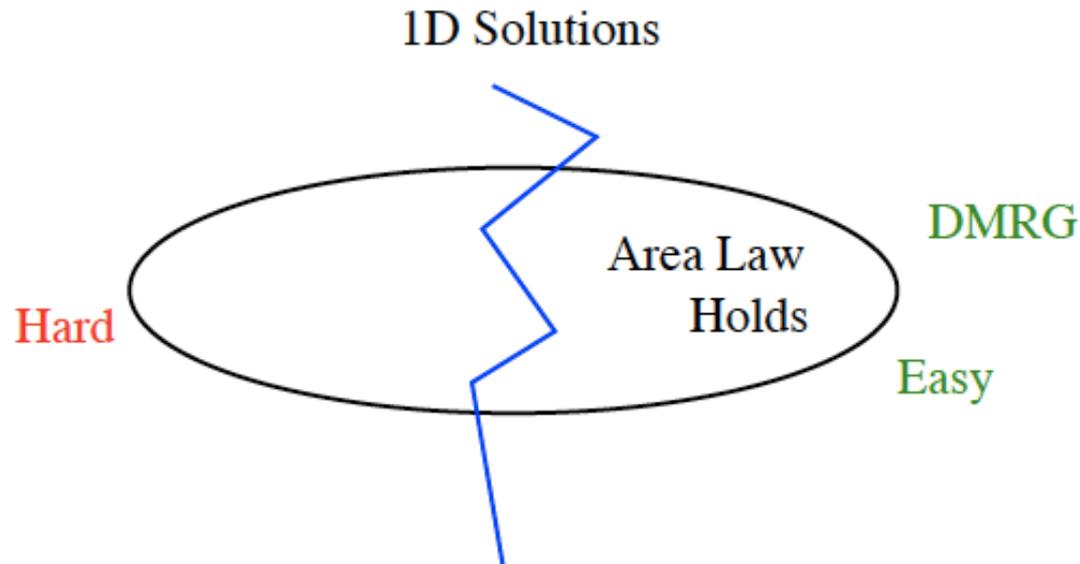


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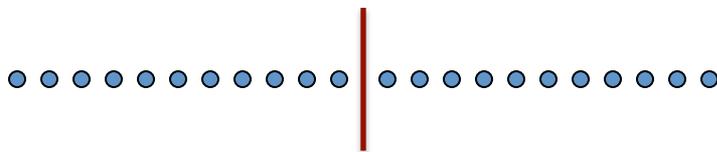
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# 1D Area Law

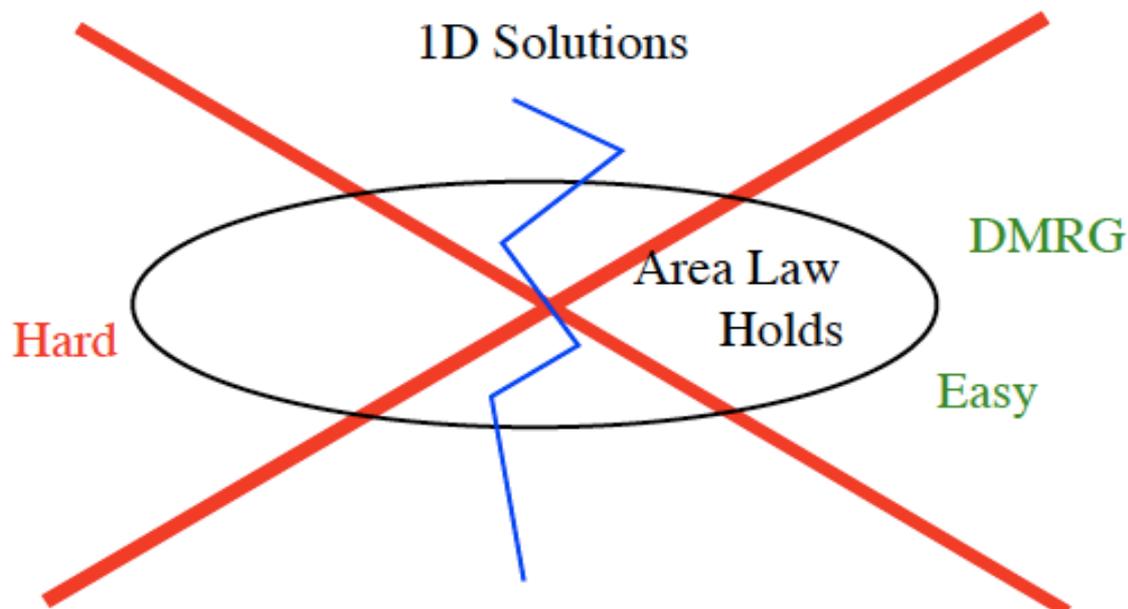


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↔ satisfies area law up to log correction

[Arad, Kitaev, Landau, Vazirani '12] Exponential improvement in parameters of the 1D area law:

$$S_{1D} = O(\log^3 d / \epsilon)$$

- Implies sublinear bond dimension MPS approximation.
- Sub-exponential time classical algorithm for finding MPS approximation to ground state.

Today: Algorithm that on input  $H_1, \dots, H_n$  outputs an MPS that has  $1-\eta$  fidelity with  $|\text{GS}\rangle$ .

Running time:  $n^{c(d,\epsilon)} \text{poly}(\eta^{-1})$ , where  $c(d,\epsilon) = 2^{O\left(\frac{\log^3 d}{\epsilon}\right)}$

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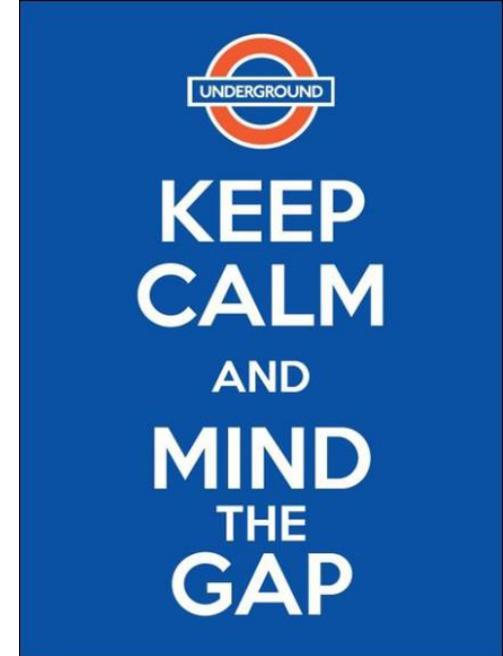
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How to reconcile these +ve results with the -ve results from Quantum Complexity Theory?

$$H = H_1 + \cdots + H_m$$

spectral gap =  $\varepsilon = E_1 - E_0$

$$|H_i| \leq 1$$



- Gapped Hamiltonians:  $\varepsilon = E_1 - E_0 = \text{constant}$
- QMA-complete instances:  $1/\text{poly}(m)$  gap



KEEP  
CALM  
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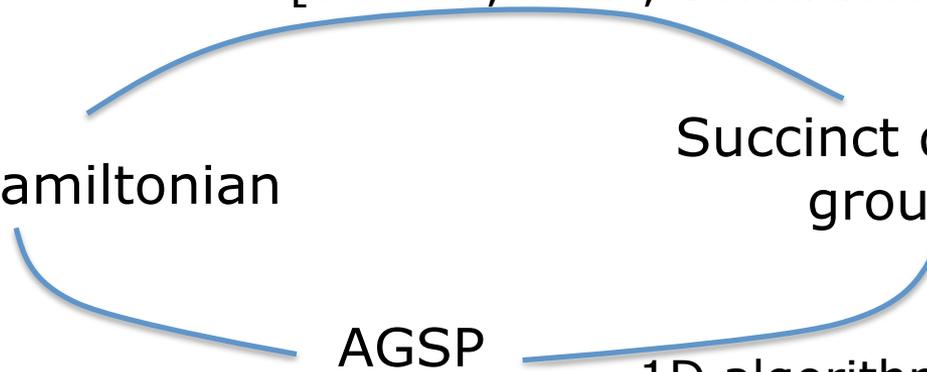
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Gapped 1D Hamiltonian

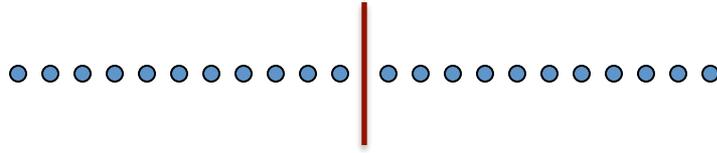
Succinct description of  
ground state

AGSP

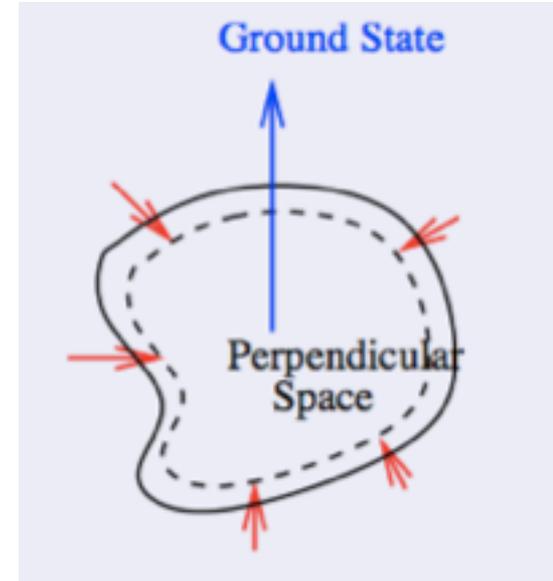
1D algorithm



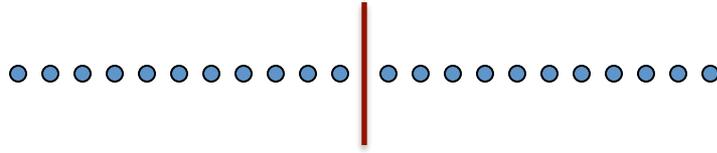
# AGSP: Approximate Ground State Projector



An AGSP is an operator  $K$  that is not “too complex” and approximately projects onto the ground state:

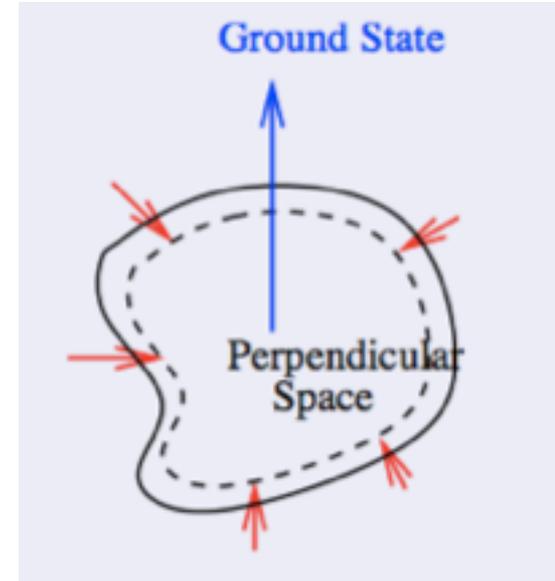


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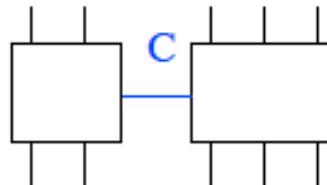


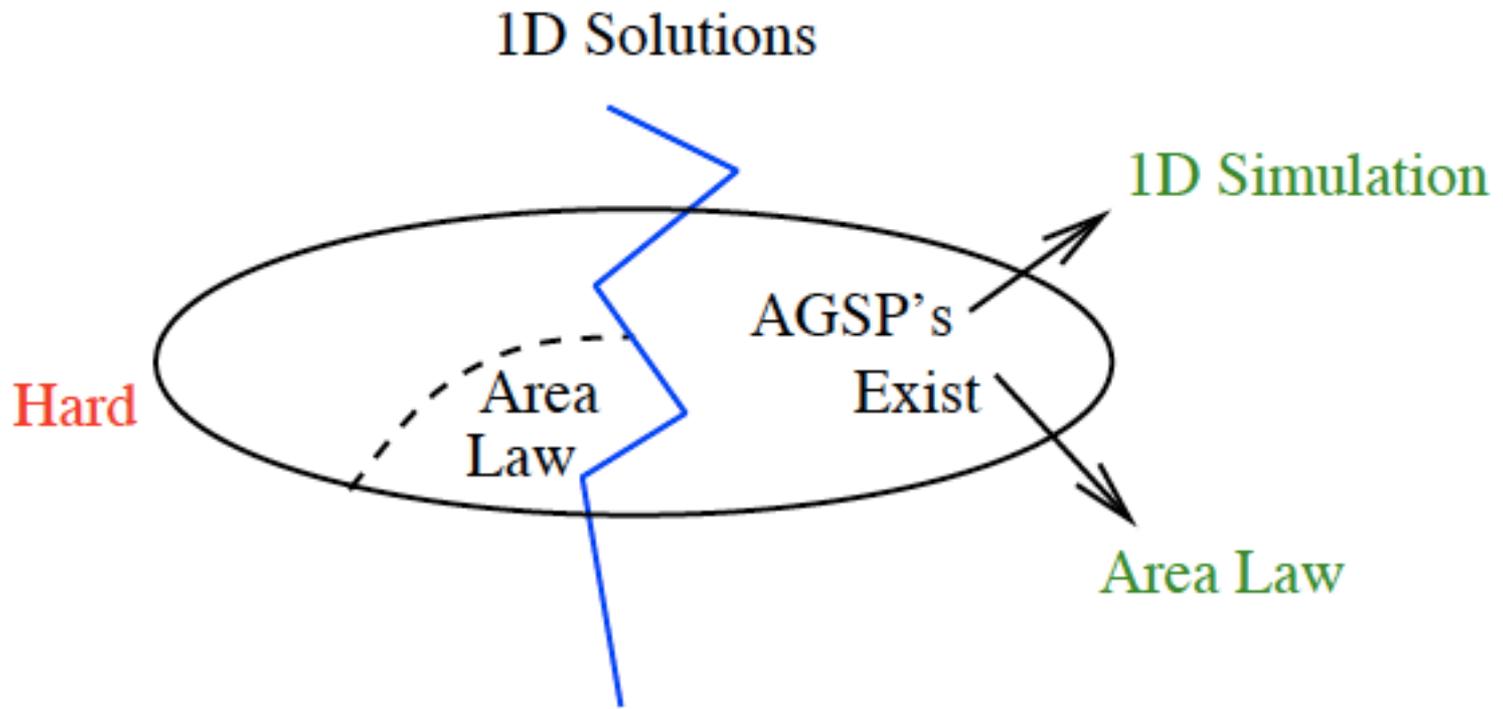
An AGSP is an operator  $K$  that is not “too complex” and approximately projects onto the ground state:

- $K|GS\rangle = |GS\rangle$
- Shrinks orthogonal space by  $\Delta < 1$
- Has low entanglement rank.



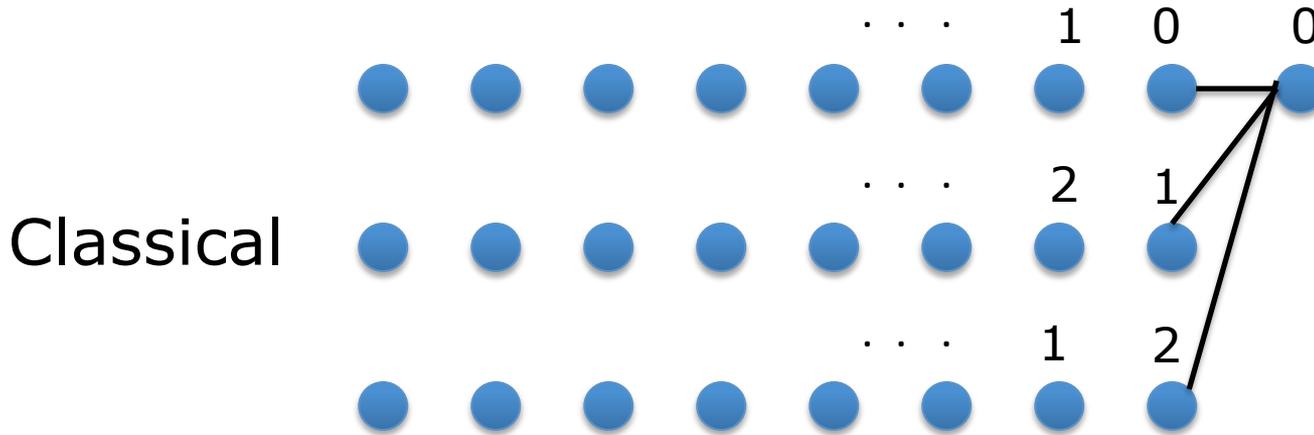
An operator on  $\mathcal{H}_1 \otimes \mathcal{H}_2$  of the form  $\sum_1^C A_i \otimes B_i$  will be said to have **entanglement rank  $C$** .





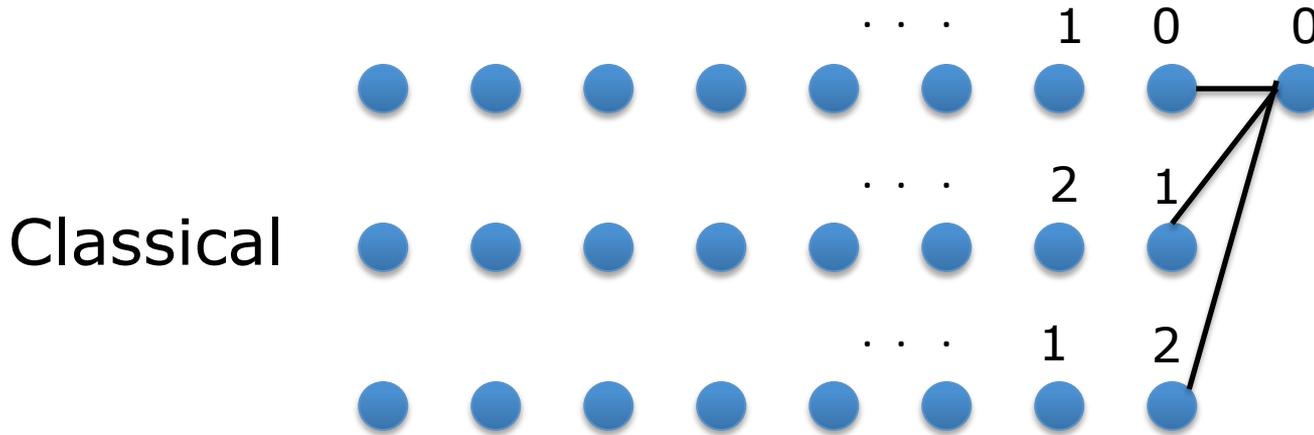
Gap → AGSP

# 1D Problems



Decoupling: Once you fix  $x_i$  can decouple left and right subproblems.

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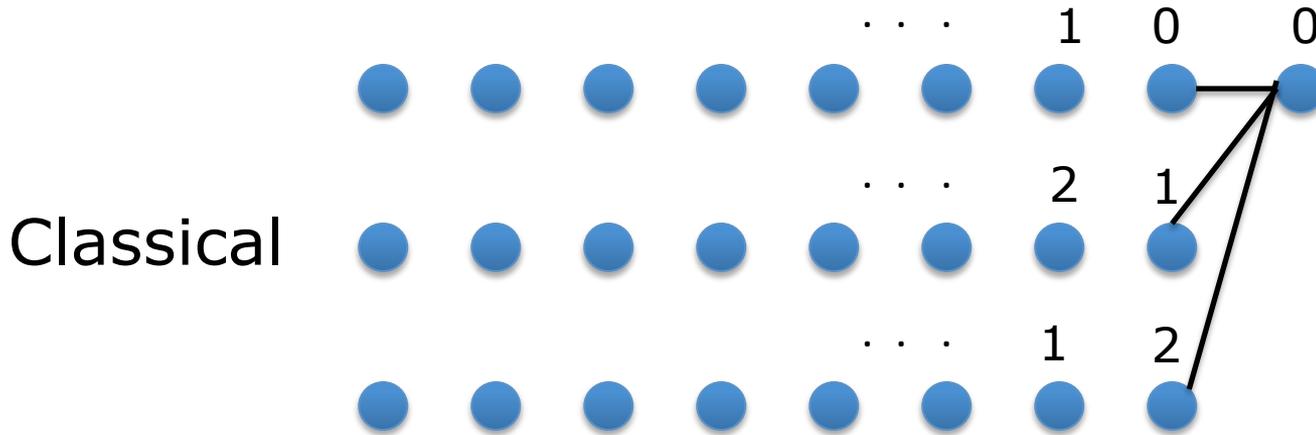


Decoupling: Once you fix  $x_i$  can decouple left and right subproblems.

Quantum: Fixing  $i$ -th qubit does not decouple.

Problem: Entanglement. Schmidt rank could grow with  $n$ .

# 1D Problems

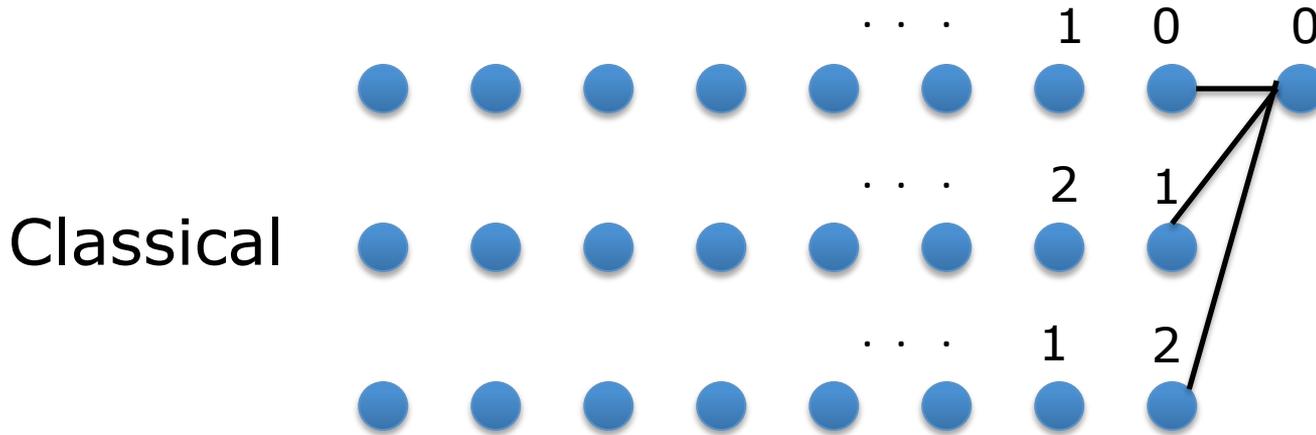


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Quantum: Boundary contraction. Density matrix on qubit + bond



# 1D Problems



Quantum: Boundary contraction. Density matrix on qubit + bond



[Hastings '07] Bond dimension is  $\text{poly}(n)$ .  
To discretize, need an  $\varepsilon$ -net of size  $\exp(n)$ .

[Arad, Kitaev, Landau, Vazirani '12] Sublinear  $2^{O(\log^{2/3} n)}$   
bond dimension  $\rightarrow$  subexponential time algorithm

# Two Ideas

1. For any given cut, and constant  $\delta$ , there is a  $\delta$ -approximation to  $|GS\rangle$  with constant bond dimension  $B_\delta$  across that cut (and  $\text{poly}(n)$  across other cuts).

Pros:

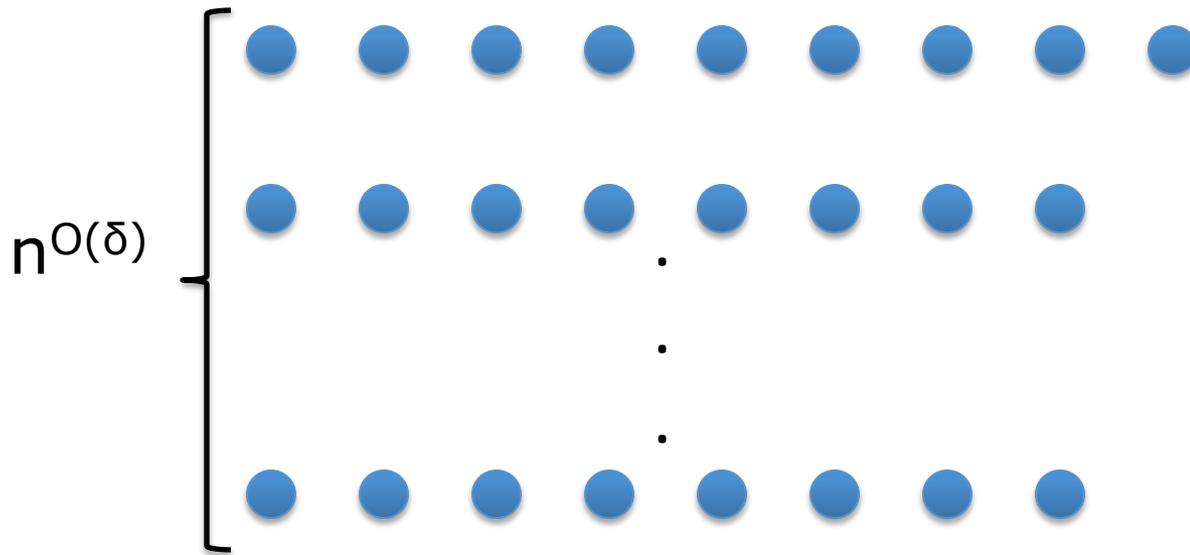
Can use a  $n^{O(\delta)}$ -net for the boundary contractions across this cut to perform the extension step.

Cons:

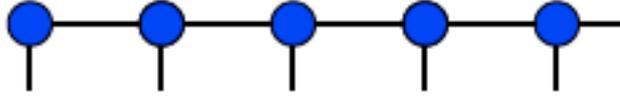
Need to repeat this process across  $n$  cuts, and the error will blow up.

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2. Use an AGSP to reduce the error to  $1/\text{poly}(n)$ .



# Upon Closer Examination

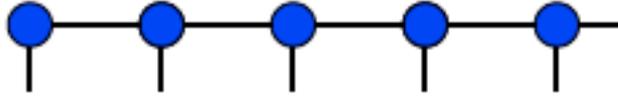


1. After the  $i$ -th iteration, the algorithm constructs an approximation to the left-half of  $|\text{GS}\rangle$ .

Can measure bond to decompose into a mixture of pure states on the first  $i$  qudits.

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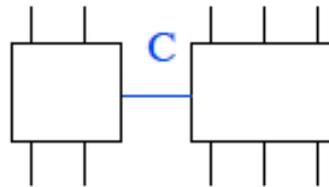


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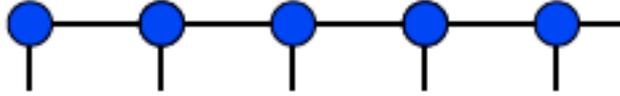
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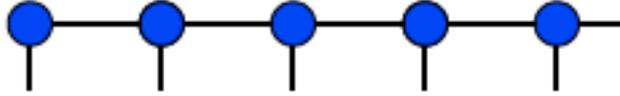
To get  $1/\text{poly}(n)$  approximation, need  $C=\text{poly}(n)$ .

# Major Problem



- What we wanted: A  $\text{poly}(n)$  cardinality set of left-states on first  $i$  qudits, such that one of them of cardinality  $\text{poly}(n)$ , such that one of them is (close to) the left-half of  $|GS\rangle$ .
- What we obtained: a set of  $\text{poly}(n)$  states on first  $i$  qudits such that their span contains the left-half of (approx. to)  $|GS\rangle$ .

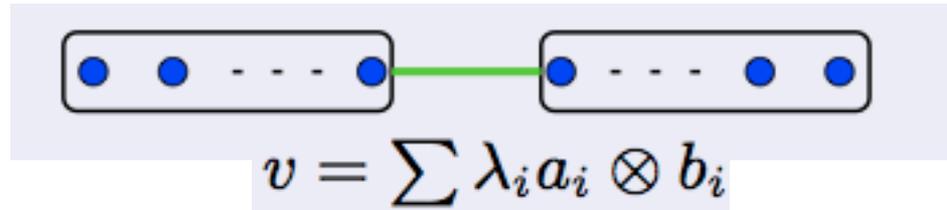
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Idea: For a given boundary contraction on  $i+1$ -st qudit, finding a left-state which lies in the span of these  $\text{poly}(n)$  states on first  $i$  qudits, and with close to the specified boundary contraction can be expressed as a poly-sized convex program.

# Convex Programming Framework for 1D Algorithm



$$\begin{aligned} \min \text{Tr}[H\rho] \\ \text{Tr}[\rho] = 1 \\ \rho \geq 0 \end{aligned}$$

- But SDP is over an exponential dimensional space.
- Create a polynomial dimensional envelope that is guaranteed to contain a close approximation to ground state.

# Viable Set

A set  $S$  of pure states on  $i$ -qudits is  $(i, s, b, \delta)$  viable if:

- There is a  $\delta$ -approx to  $|GS\rangle$  whose left Schmidt vectors are in the span of  $S$ .
- Each element of  $S$  has an MPS representation with bond dimension  $\leq B$ .
- $|S| = s$

## $i \rightarrow i+1$ : Four steps

Extension: Append a qudit.  $s \rightarrow sd$

Cardinality Reduction:

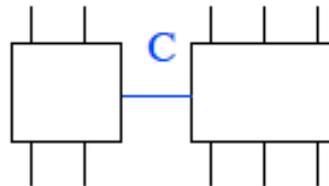
Fix a  $\delta/n$ -net over the space of boundary contractions of constant dimension  $B_\delta$  at  $i+1$ -st boundary.

$$\min \sum_{j=1}^{i-1} \text{tr}(H_j \sigma)$$

$$\text{such that } \left\| \text{tr}_{[1, \dots, i-1]}(\sigma) - X \right\|_1 \leq \frac{c_\epsilon}{2n'}$$

$$\text{tr}(\sigma) = 1, \quad \sigma \geq 0.$$

Error reduction: Apply AGSP to each element of  $S$ .



Bond Trimming: Truncate MPS representations.

# Analysis

	$i$	$s$	$B$	$\delta$
Start	$i - 1$	$p(n)p_1(n)$	$p(n)p_2(n)$	$c_\epsilon/n$
<b>Extension:</b>	$\rightarrow i$	$dp(n)p_1(n)$	$p(n)p_2(n)$	$c_\epsilon/n$
<b>Size Trimming:</b>	$\rightarrow i$	$p_1(n)$	$p'(n)p_2(n)$	$1/12$
<b>Bond Trimming:</b>	$\rightarrow i$	$p_1(n)$	$p_2(n)$	$1/2$
<b>Error reduction:</b>	$\rightarrow i$	$p(n)p_1(n)$	$p(n)p_2(n)$	$c_\epsilon/n$

# Uniform AGSP

Assume frustration-free.

$I - H/n$  stabilizes  $|GS\rangle$  and  $|H|perp\rangle| \leq 1 - \epsilon/n$

So  $(I - H/n)^n$  shrinks  $|perp\rangle$  by constant factor

$$\frac{1}{n^n} (I - H_1)(I - H_2) \cdots (I - H_n)$$
$$= \frac{1}{n^n} \sum_{i_1 \cdots i_n} H_{i_1} \cdots H_{i_n}$$

$K =$  Sample  $\text{poly}(n)$  terms.

By matrix Chernoff bounds good approximation.

# Conclusions

- A more local algorithm?
- AGSP
- 2D systems?
- Dependence on  $\varepsilon$