# Thermal States as Convex Combinations of Matrix Product States

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# Strongly Interacting Spin Chains: Ground States

• Matrix product states (MPS) form a sub-manifold  $M_{MPS}^D \subset \mathbb{C}^{d^n}$  of the state space of n distinguishable spin-d particles. They are represented as

$$|\psi[A]
angle := \sum_{i_1,\dots,i_n} \operatorname{Tr}[A_{i_1}\cdots A_{i_n}] \ket{i_1}\cdots \ket{i_n},$$

where for  $j=1,\ldots,n$  the  $A_{i_j}$  are  $D\times D$  dimensional complex matrices. The parameter D is called the bond dimension.

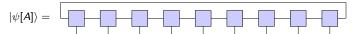


Figure from [Bridgeman & Chubb '17]

- MPS with low bond dimension D capture the ground state physics of one-dimensional local gapped Hamiltonians [Hastings '07].
- Various algorithms that (efficiently) find the best approximate state within the sub-manifold M<sup>D</sup><sub>MPS</sub> for the ground state, e.g., variationally using the density matrix renormalization group (DMRG).

# Strongly Interacting Spin Chains: Thermal States

• We are interested in thermal states of one-dimensional local Hamiltonians H at non-zero temperature T > 0:

$$\rho(H,T) := \frac{\exp(H/T)}{\operatorname{Tr}\left[\exp(H/T)\right]}.$$

 Matrix product operators (MPO) provide a faithful approximation [Hastings '06] and (efficient) algorithms for finding them are known [Verstraete et al. '04].

## Major conceptual drawback

No distinction made between classical and quantum correlations  $\Rightarrow$  classical correlations should be dealt with by using Monte Carlo sampling techniques and one should not waste a large bond dimension to those fluctuations.

 MPO based algorithms have some further practical drawbacks, such as positivity issues as well as blow up of bond dimension for purification based methods

## Main Result

- Let  $H = \sum_{i \in I} h_i$  be a one-dimensional local Hamiltonian with uniform bound on the interaction strength  $||h_i||_{\infty} \le 1 \ \forall i \in I$ .
- Can we approximate the thermal state

$$\rho(H,T) = \frac{\exp(H/T)}{\operatorname{Tr}\left[\exp(H/T)\right]} \text{ for fixed temperature } T > 0$$

as a convex combination of MPS with low bond dimension?

#### Thermal states as convex combinations of MPS

For any  $\varepsilon\in(0,1]$  there exists a bond dimension  $D\in\mathbb{N}$  and a probability measure  $\mathrm{d}\mu_{\varepsilon}$  on the manifold  $M_{MPS}^D$  such that

$$\left\| \rho(H,T) - \underbrace{\int d\mu_{\varepsilon}([A])|\psi[A]\rangle\langle\psi[A]|}_{=: \ \rho[\mu_{\varepsilon}]} \right\|_{1} \leq \varepsilon,$$

where  $||X||_1 := \mathrm{Tr}[|X|]$ . The bond dimension D scales quasi-polynomially in  $\varepsilon^{-1}$  and system size, and doubly exponential in  $T^{-1}$ .

#### Proof Ideas I

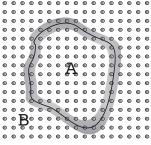


Figure from [Wolf et al., 08].

 Thermal states with finite correlation length have an area law for the quantum mutual information (QMI) [Wolf et al. '08]

$$I(A:B)_{
ho}:=H(A)_{
ho}+H(B)_{
ho}-H(AB)_{
ho}$$
 for  $H(A)_{
ho}:=-\mathrm{Tr}\left[
ho_{A}\log
ho_{A}
ight].$  That is,  $I(A:B)_{
ho}\lessapprox|\delta A|$  .

 QMI measures (quantum and classical) correlations ⇒ can area law be extended to other entanglement measures?

#### Proof Ideas II

• For our purposes we are interested in an area law for entanglement of formation

$$E_F(A:B)_\rho := \inf \sum_i p_i H(A)_{\rho^i}, \quad \text{with decompositions } \rho_{AB} = \sum_i p_i |\rho^i\rangle \langle \rho^i|_{AB}.$$

 $\Rightarrow$  this would imply exactly what we want — up to  $H(A)_{\rho} \approx H_{\max}(A)_{\rho}$ .

One might think that

$$E_F(A:B)_{\rho} \stackrel{?}{\leq} I(A:B)_{\rho}$$

 However, using concentration of measure phenomena [Hayden et al. '06] show that maybe somewhat surprisingly

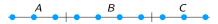
$$E_F(A:B)_\rho\gg I(A:B)_\rho$$
 is possible.

 Another entanglement measure (tripartite) is the conditional quantum mutual information (CQMI)

$$I(A:C|B)_{\rho}:=H(AB)_{\rho}+H(BC)_{\rho}-H(B)_{\rho}-H(ABC)_{\rho}\geq 0.$$

#### Proof Ideas III

• Exponential decay of  $I(A:C|B)_{\rho}$  in the system size of B connecting A and C?



[Brandão & Kastoryano '16] and [Swingle & McGreevy '16]

• Connection to Markov chain structure [Fawzi & Renner '15] and [many more]

$$I(A:C|B)_{\rho} \geq \frac{1}{4} \left\| \rho_{ABC} - (\mathcal{I}_A \otimes \Lambda_{B \to BC})(\rho_{AB}) \right\|_1^2 \,,$$

where  $\Lambda_{B\to BC}$  denotes quantum channel only acting on the region B.



• However, statement about CQMI not known for general systems of interest.

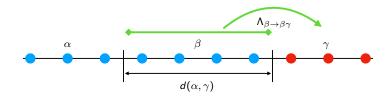
#### Proof Ideas IV

# Local Markov chain structure [Kato & Brandão '16]

Let  $H=\sum_{i\in I}h_i$  be a one-dimensional local Hamiltonian with  $\|h_i\|_\infty \leq 1 \ \forall i\in I$ . Then, for any tripartite split of the lattice  $\alpha\beta\gamma$ , there exists a local quantum channel  $\Lambda_{\beta\to\beta\gamma}$  only acting on the region  $\beta$  such that

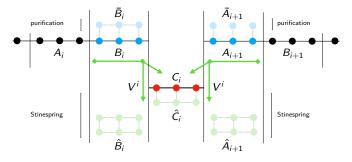
$$\left\| \rho_{\alpha\beta\gamma}(H,T) - \left( \mathcal{I}_{\alpha} \otimes \Lambda_{\beta \to \beta\gamma} \right) \left( \rho_{\alpha\beta}(H,T) \right) \right\|_{1} \le \exp \left( -q(T)\sqrt{d(\alpha,\gamma)} \right),$$

where  $d(\alpha, \gamma) \ge \ell_0$  denotes the minimal distance in system size between  $\alpha$  and  $\gamma$ , and  $q(T) := C \exp(-c/T)$  for some universal constants  $0 < \ell_0, C, c < 100$ .



## **Proof Sketch**

- For fixed T>0 and  $\varepsilon\in(0,1]$  use [Kato & Brandão '16] in parallel to:
  - **1** Construct global MPS  $|\Psi(D,\varepsilon)\rangle$  with quasi-polynomial scaling in n and  $1/\varepsilon$
  - ② Show that  $|\Psi(D,\varepsilon)\rangle$  is purification of convex combination of MPS—denoted by  $\rho[\mu_{\varepsilon}]$
  - **3** Show that  $\rho[\mu_{\varepsilon}]$  is close to thermal state  $\rho(H, T)$



L=
$$A_1B_1C_1$$
  $A_2B_2C_2\cdots A_lB_lC_l$  with  $|A_i|=|B_i|=2^{\log^2(n/\varepsilon)}$ ,  $|C_i|=2^{5\xi\cdot\log^2(n/\varepsilon)}$  and  $\xi$  corr. length  $\Rightarrow$  choose  $\alpha_i=L/(\beta_i\gamma_i)$ ,  $\beta_i=B_iA_{i+1}$ ,  $\gamma_i=C_i$ 

# **Application: Numerics**

- MPO numerical methods to approximate thermal state [Verstraete et al. '04]
- Alternatively minimally entangled typical thermal states (METTS) [White '09]:
  - **1** Randomly choose product state  $|\vec{i}\rangle:=|i_1\rangle\cdots|i_n\rangle$
  - Approximate the imaginary time evolved

$$|\phi(\textit{T},\vec{i}\,)\rangle := \textit{p}(\vec{i}\,)^{-1/2}\exp\left(-\beta \textit{H}/2\right)|\vec{i}\,\rangle, \quad \text{with } \textit{p}(\vec{i}\,) := \langle\vec{i}\,|\exp\left(-\beta \textit{H}\right)|\vec{i}\,\rangle$$

by an MPS with low bond dimension

- **③** Collapse a new product state  $|\vec{i'}\rangle$  from  $|\phi(T,\vec{i})\rangle$  with probability  $p(\vec{i}\rightarrow\vec{j}):=|\langle\vec{i'}|\phi(T,\vec{i})\rangle|^2$  and return to step 2
- ⇒ approximately creates convex combination of MPS with low bond dimension

$$\frac{1}{Z} \sum_{\vec{i}} p(\vec{i}) |\phi(T, \vec{i})\rangle \langle \phi(T, \vec{i})|$$

- Mathematical justification for (heuristic) METTS algorithm
- Similar mathematical justification for extension to algorithms time evolving quantum systems—hydrodynamics [Leviatan et al. '17]

## Conclusion

#### Main result

The thermal state of every one-dimensional local Hamiltonian with uniform bound on the interaction strength is approximated as a convex combination of MPS with bond dimension scaling quasi-polynomially in  $\varepsilon^{-1}$  and system size:

$$ho(H,T)pprox_{arepsilon}\int\mathrm{d}\mu_{arepsilon}ig([A]ig)|\psi[A]
angle\langle\psi[A]|\,.$$

- Can the parameter in our main result be improved? 

   quasi-polynomial versus

   polynomial scaling of bond dimension in terms of system size [Kim '17].
- For our proof strategy, this boils down to improving [Kato & Brandão '16]

$$\left\| \rho_{\alpha\beta\gamma}(H,T) - \left( \mathcal{I}_{\alpha} \otimes \Lambda_{\beta \to \beta\gamma} \right) \left( \rho_{\alpha\beta}(H,T) \right) \right\|_{1} \leq \exp\left( -q(T)\sqrt{d(\alpha,\gamma)} \right)$$

to  $\exp(-q(T)d(\alpha,\gamma))$  dependence. Examples in [Swingle & McGreevy '16].

- Alternatively we could start from known MPO methods [Hastings '06].
- Physics: say more about numerics for METTS algorithm and hydrodynamics?

Thanks. Check out arXiv:1709.07423.