Tensor networks and entanglement spectroscopy

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Station Q



Entanglement spectrum Spin-probability distribution in ES (by momentum) 16 10 14 12 $-\log(p_a)$ \tilde{S} 10 \widecheck{D} -10g 2 0 0 -1.0 -0.5 0.0 0.5 1.0 -2 1 2 3 -10 S^{z} k_a/π MagLab Theory Winter School 2015

review of MPS and many of the figures in this talk: Kjäll, Zaletel, Mong, Bardarson & Pollmann 2012

Outline

- Day 1: Introduction to tensor network numerics
 - Entanglement and the Schmidt decomposition
 - 1D: the matrix product state ansatz
 - DMRG
 - 2D: the 'tensor network' ansatz
 - Dimer & RVB wavefunctions
 - Open problems
- Day 2: Entanglement spectroscopy: detecting emergent anyons in numerics

Goal:

Find an unbiased method for numerically calculating the low energy properties of any local (perhaps frustrated) quantum Hamiltonian in a time which is polynomial in the system size (or independent of system size with translation invariance).

Some amusing cold water first:

[David Pérez-Garcia, Toby Cubitt & Michael Wolf]

Our result (informal statement)

Problem (Spectral Gap):

Input: nearest-neighbor interaction h Output: decide if H has a gap or not.

Theorem:

The Spectral Gap problem is undecidable.

There is no algorithm that on input h decides it

Corollary: There exist nearest neighbor interactions for which the existence or absence of gap cannot be proven within the axioms of mathematics.

The storage problem

Classical:
$$\begin{array}{c} \overbrace{\uparrow\uparrow\downarrow\cdots\uparrow}^{L} \\ \uparrow\uparrow\downarrow\cdots\uparrow \\ \Downarrow\\ 110\cdots1 \quad \Rightarrow \quad S = \log_2(2^L) = L \end{array}$$

Information linear in system size

Quantum:
$$|\Psi\rangle = \Psi_0 |\uparrow\uparrow\cdots\rangle + \Psi_1 |\downarrow\uparrow\cdots\rangle + \Psi_2 |\uparrow\downarrow\cdots\rangle + \cdots$$

(floating points)

$$\{\Psi_i\} \implies S \sim 4 \cdot 8 \cdot 2^L$$

Information **exponential** in system size (limits exact-diagonalization)

Quantum compression?

mz_thesis — bash — 63×7
michaels-mbp-2:mz_thesis mzaletel\$ ls -s
total 1368
1040 mz_thesis.tex 328 mz_thesis.tex.zip
michaels-mbp-2:mz_thesis mzaletel\$

My thesis actually contains surprisingly little information...

We are interested in states which have low energy for local Hamiltonians

How big is the important space?



Hokey Estimate I



Parameterize space of ground states via space of local Hamiltonians:

$$\hat{H} = \sum_{i=1}^{L} \hat{H}_i$$

Finite info for each \hat{H}_i , so

 $S \propto L$

Estimate II: the 'convenient illusion of Hilbert space'

from Poulin, et al., 2011

The Setup:

Start in a product state:
$$|t=0
angle=\otimes_{n=1}^{L}|^{2}$$

Time evolve under an *arbitrary* k-body Hamiltonian: $\hat{H}(t)$

After any time $t \sim \operatorname{poly}(L)$ we can only access a fraction

$$\frac{\operatorname{Vol}(\{|t\rangle\})}{\operatorname{Vol}(\mathcal{H})} < L^L \epsilon^{2^L}, \epsilon < 1$$

of the many-body Hilbert space

Schmidt decomposition

$$\begin{array}{c|c} A & B \end{array} & \mathcal{H} = \mathcal{H}_L \otimes \mathcal{H}_R \end{array}$$

$$|\Psi\rangle = \sum_{i,j=1}^{D_L,D_R} \Psi_{ij} \,|i\rangle_L \,|j\rangle_R \qquad \qquad D_L \times D_R \,\, \text{\#s}$$

If A & B are uncorrelated (not-entangled), there is a special basis in which $|\Psi\rangle=|\alpha\rangle_L\,|\alpha\rangle_R\qquad D_L+D_R~~\text{#s}$

More generally, there is a special basis - the Schmidt basis in which

$$|\Psi\rangle = \sum_{\alpha=1}^{\chi} \lambda_{\alpha} |\alpha\rangle_{L} |\alpha\rangle_{R} \qquad \qquad \chi \times (D_{L} + D_{R}) \text{ #s}$$

Schmidt compression



$$\left|\Psi\right\rangle = \sum_{\alpha=1}^{\chi} \lambda_{\alpha} \left|\alpha\right\rangle_{L} \left|\alpha\right\rangle_{R} \qquad \qquad \chi \times (D_{L} + D_{R}) \text{#s}$$

The "entanglement entropy:"

$$\sum_{\alpha} \lambda_{\alpha}^2 = 1, \quad S_E = -\sum_{\alpha} \lambda_{\alpha}^2 \log(\lambda_{\alpha}^2)$$

When

$$e^{S_E} \ll D_L$$

we can keep only important contributions and compress the state!

A qubit of entanglement

$$\begin{split} |\psi\rangle &= \frac{1}{2} \Big(|\uparrow\rangle_A + |\downarrow\rangle_A \Big) \Big(|\uparrow\rangle_B + |\downarrow\rangle_B \Big) \quad \Longrightarrow S = 0 \\ |\psi\rangle &= \frac{1}{\sqrt{2}} \Big(|\uparrow\rangle_A |\downarrow\rangle_B + |\downarrow\rangle_A |\uparrow\rangle_B \Big) \quad \Longrightarrow S = \log 2 \\ S &= -\sum \lambda_{\gamma}^2 \log \lambda_{\gamma}^2 \end{split}$$





[Srednicki]

Ground states: $S_E(\ell) \sim \ell^{D-1}$



Proven in 1D for gapped states [Hastings 2005]

Mild violations for certain critical systems (1+1 CFT, Fermi surfaces...)

Volume law expected at finite energy density (eigenstate thermalization)

The Area Law: $S_E(\ell) \sim \ell^{D-1}$ for D = 1 spin chain



The MPS Ansatz

[Fannes et al. 1992; Östlund & Rommer 1995]



The MPS Ansatz





Compressed L-site wavefunction into $L d \cdot \chi \cdot \chi$ tensors

MPS: Computing observables

Exact diagonalization: $\sim \mathcal{O}(e^{\alpha L})$

$$\langle \psi | O | \psi \rangle = \qquad \begin{array}{c} \langle \psi | \\ \hline 0 \\ \hline \psi \rangle \end{array}$$

MPS:
$$\sim \mathcal{O}(\chi^3)$$

MPS: Computing observables

Simplification Rule:

ΛΓ

=

16

ΓΛ

 $\Gamma^*\Lambda$

 \diamond] =



• Local expectation values

$$\langle \psi | O^{[r]} | \psi \rangle = egin{pmatrix} O^{[r]} & \lambda \ \Gamma \ \lambda \\ & & & & & \\ & & & & \\ & & &$$

• Correlation functions

 Correlation length: Second largest eigenvalue of the transfer matrix DMRG : Density Matrix Renormalization Group

[White 1992; McCullough 2008]

Given $\,H$, how do we find good a MPS approximations to the g.s.?

$$\text{MPS:} \ \{\Gamma^{[j]}\lambda^{[j]}\} \to |\Psi\rangle$$

$$\label{eq:Minimize} \text{Minimize } E(\Gamma^{[j]}\lambda^{[j]}) = \frac{\langle \Psi | \, \hat{H} \, | \Psi \rangle}{\langle \Psi | \Psi \rangle}$$

Non-linear minimization problem

Strategy:

- 1. Hold all tensors fixed but those at site j
- 2. Solve quadratic problem at site j
- 3. Move on to site j + 1; repeat



Screws up MPS structure!

For local-ish Hamiltonians, generalize MPS to Matrix Product Operator (MPO)



Review of algorithm: Kjäll, Zaletel, Bardarson, Mong & Pollmann 2012, 1212.6255

[Verstraete, Porras & Cirac 2004; Murg 2008]

 $\langle \Psi | \hat{H} | \Psi \rangle$



Focus on two sites

 $E = \langle \Theta | H_{eff} | \Theta \rangle =$





Variational Wavefunction:



Orthonormal basis for 2 sites + L / R Schmidt states

Lower the energy by finding the ground state of effective Hamiltonian (Lanczos, etc.):



$$H_{eff} \left| \tilde{\Theta} \right\rangle = E_0 \left| \tilde{\Theta} \right\rangle$$

This is where you burn CPU hours:



Bring ansatz back to MPS form

$$|\tilde{\Theta}\rangle = \sum_{\alpha=1}^{\chi} |\alpha\rangle_A \,\tilde{\Lambda}_\alpha \, |\alpha\rangle_B$$





Update L / R environments





"Sweep" until convergence









Comments

Algorithm works *unchanged* on an infinitely long system with periodic unit cell: "iDMRG"

[McCullough 2008]

Complexity: length / unit cell = L

 $\chi \sim e^{S_E}$

(holding Hamiltonian fixed)

CPU: $L\chi^3$ 1D gapped: $S_E \sim \text{const}$ 1D CFT: $S_E \sim \frac{c}{6} \log(\xi/a)$ RAM: $L\chi^2$ 2D: $S_E \sim L_y$

Time evolution

Trotter-decompose U(dt) into 2-site gates:





TEBD [Vidal 03]

Dynamical structure factor: $S(k, \omega)$ $C(x,t) = \langle \psi_0 | S_x^-(t) S_0^+(0) | \psi_0 \rangle$ $S(k,\omega) = \sum_x \int_{-\infty}^{\infty} dt e^{-i(kx+\omega t)} C(x,t)$



Time evolution

Experiments of Coldea, et al.: 1D TFI perturbed by order parameter

$$H = -J' \sum_{n} S_{n}^{z} S_{n+1}^{z} - h^{x} \sum_{n} S_{n}^{x} - h^{z} \sum_{n} S_{n}^{z} \qquad (2)$$

$$- J_{p} \sum_{n} \left(S_{n}^{x} S_{n+1}^{x} + S_{n}^{y} S_{n+1}^{y} \right) + J_{B} \sum_{n} S_{n}^{z} S_{n+2}^{z}.$$



Near QCP: masses of emergent excitations root lattice of E_8

2D DMRG: The Kludge (alias - snake)



Order the 2D lattice into 1D chain with longer-range interactions



Entanglement scales with circumference: $S_E \sim L_y$

Complexity:

$$L_x L_y e^{\alpha L_y}$$

DMRG

 $e^{\alpha L_x L_y}$

Exact Diagonalization

2D DMRG

Works if you are lucky (i.e., near thermodynamic limit on small cylinders)

Frustrated magnetism & Spin-liquids on cylinders



[Yan, Huse, White 2010]

Fractional quasiparticles in the fractional quantum hall effect



[Zaletel, Mong, Pollmann 2012]

More on measuring topological order in these studies tomorrow

2D Tensor network: The Hope

[Verstraete & Cirac, 2004]



Example: dimer model

Kagome NN dimer covering:



[from Yejin Huh, 2011]

$$|\Psi\rangle = \sum_{\text{dimer coverings}} |\text{hardcore-dimers}\rangle$$





Using different topology than square TN: but you can always regroup things to turn it into "standard" form

$$\chi = 2: \quad \alpha \in \{0, 1\}$$





$$A^{p}_{\alpha\beta} = \begin{cases} 1 & \text{if } p = \alpha = \beta \\ 0 & \text{if else} \end{cases} \qquad B_{\alpha\beta\gamma\delta} = \begin{cases} 1 & \text{if } \alpha + \beta + \gamma + \delta = 1 \\ 0 & \text{if else} \end{cases}$$

Glue presence of dimer to "virtual" index

The constraint (no physical index)

Why is Kagome still being studied with snakes?

Finding the 2D TN is hard!



[from Stoudenmire 2011]

Why is Kagome still being studied with snakes?

*** Unsolved problem 0: which phases of matter can be represented by finite dimensional 2D TN? ***

1D MPS: represents gapped states of local H

2D TN: not known (certain things can't be: fermi surface)

*** Unsolved problem 1: what is the *right* way to approximately calculate observables in a 2D TN? ***

Calculating expectation value in MPS *exactly*: linear complexity in size Calculating expectation value in 2d TN *exactly*: exponential complexity in size

*** Unsolved problem 2: what is the *right* way to find a 2D TN given H? ***

DMRG: it works. complexity χ^3 2D TN: algorithms proposed, but not fully understood what the nature of the approximations is. complexity $\chi^8-\chi^{10}$

Thanks!

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MagLab Theory Winter School 2015
Tensor networks and entanglement spectroscopy







MagLab Theory Winter School 2015

Outline

- Day 1: Introduction to tensor network numerics
- Day 2: Entanglement spectroscopy: detecting emergent anyons in numerics
 - Topological entanglement entropy & quantum dimensions
 - The entanglement spectrum
 - Topological degeneracy of the cylinder
 - Minimally entangled states
 - The Kagome SL
 - Topological Spin & Momentum Polarization







'Symmetry protected' topological (SPT) order:

No anyonic excitations: distinction requires symmetries

1.

2.

З.

- Quantized responses to flux threading (+generalizations)
- e.g. 1D spin-1 Haldane chain (AKLT), 2D IQHE, topological insulators

(also chiral order: p+ip superconductor)



Topological order. Need non-local order parameter: **quantum entanglement**



[from Pollmann]

Nothing on symmetries today. Just "intrinsic:" TQFT

Goal: given ground state wavefunction, can we determine the topological order?



Yesterday: Entanglement Entropy

$$S = -\text{Tr}\left[\rho_A \log(\rho_A)\right] = -\sum_{\alpha} \lambda_{\alpha}^2 \log(\lambda_{\alpha}^2)$$



$$S = \alpha \ell - \operatorname{const} + \mathcal{O}(e^{-\ell/\xi})$$

Area law: UV physics

Dimensionless: universal?

Topological Entanglement Entropy

[Kitaev & Preskill, Levin & Wen 2006]



area law corners TEE

$$S_B = \frac{\alpha |\partial B| + \sum_{i=1}^{5} c_i}{|Garbage|} - \frac{\gamma}{|O(e^{-\ell/\xi})|} + \mathcal{O}(e^{-\ell/\xi})$$

Topological Entanglement Entropy

[Kitaev & Preskill, Levin & Wen 2006]

In the ground state:



 $-\gamma = S_{ABC} - S_{AB} - S_{BC} - S_{CA} + S_A + S_B + S_C$

Should be a universal quantity sensitive to 'non-local' part of S





$$S_{\text{topo}} = 2S_3 - \frac{3}{2}S_4 = -\log \mathcal{D} \equiv -\gamma$$
 (15)

Eq. (15) is our main result. Note that it follows if we

from Kitaev & Preskill 2006



Quantum dimensions: a tiny intro

Pin down N anyons on a disc or sphere:



 $d_a = 1$: 'abelian' anyon

 $d_a > 1$: 'non-abelian' anyon

TEE: the 'total quantum dimension'

$$-\gamma = S_{ABC} - S_{AB} - S_{BC} - S_{CA} + S_A + S_B + S_C$$

$$\gamma = \log(\mathcal{D}), \qquad \mathcal{D} = \sqrt{\sum_{a=1}^{\# \text{species}} d_a^2}$$

'total quantum dimension'

Z_2 Gauge theory = toric code = Z_2 SL: $a \in \{1, e, m, em\}, \ d_a = 1, \ \mathcal{D} = \sqrt{1 + 1 + 1} = 2, \ \gamma = \log(2)$

'Trivial' phase: no anyons $a \in \{1\}, \ d_a = 1, \ \mathcal{D} = \sqrt{1} = 1, \ \gamma = \log(1) = 0$

$$\gamma > 0$$
 : anyons!

This is hard to do in small systems:



We will return to the practical "cylinder" way shortly: but we need to figure out some subtleties first!

Suppose you've taken note of the properties of a region (density, energy, etc...)

and an excitation wanders in



Can you tell if the excitation is an anyon?

Can you tell what type?

Of course! use mutual statistics





 $S_{a?} = 1 \ \forall a \Rightarrow ? = 1$

Detecting an anyon requires a *loop:* just like a gaussian surface detects charge

Can an *entanglement cut* serve as a "gaussian surface" for detecting "anyon charge" ?





$$\left|\Psi\right\rangle = \sum_{\alpha} \lambda_{\alpha} \left|\alpha\right\rangle_{A} \left|\alpha\right\rangle_{B}$$

$$\sum_{\alpha} \lambda_{\alpha}^2 = 1, \quad S_E = -\sum_{\alpha} \lambda_{\alpha}^2 \log(\lambda_{\alpha}^2)$$

The entanglement spectrum

$$\left|\Psi\right\rangle = \sum_{\alpha} \lambda_{\alpha} \left|\alpha\right\rangle_{A} \left|\alpha\right\rangle_{B}$$

Schmidt states can be assigned good quantum numbers: (here ang. momentum)

$$\hat{L}^{z} \left| \alpha \right\rangle_{B} = L_{\alpha} \left| \alpha \right\rangle_{B}$$



'Entanglement spectrum' vs momentum [Kitaev & Preskill 06; Haldane & Li 08]



from FQHE, Moore-Read state [Zaletel, Mong & Pollmann 2012]



Aside:

It is not *in general* true that the low - energy part of the entanglement spectrum "is" like the low energy part of the physical edge theory

Certain *averaged* properties - like entanglement entropy - are robust. These depend on the *high energy* part of ES.

Anomalies of physical edge = anomalies in entanglement edge (this is how charge pumping works)

Numerical experiment:









If B is big, ES changes if and only if ? is an anyon!





[Kitaev & Preskill 2006; Papic et al. 2010]



TEE: Take II

(continuum, smooth cut: no garbage)



$S_B = \alpha |\partial B| - \log(\mathcal{D}) + \log(d_a)$

a = 1 (no anyon) is special case

Topological ground state degeneracy



Sphere: generically unique ground state



Torus: m degenerate ground states

m : # of anyon species

The cylinder has genus too!

Infinitely long cylinder: same gsd M as torus!

(we'll remind ourselves why shortly)



Great for numerics! *No* edge effects, uses full translation invariance, and still has gsd

[Cincio & Vidal 2012; Zaletel, Pollmann & Mong 2012]

Sorting out cylinders



Entanglement entropy of infinite cylinder vs circumference



Minimally entangled states

[Zhang, Grover, Turner, Oshikawa & Vishwanath]



Infinite cylinder:
$$S=lpha L-\gamma$$

What's
$$\gamma$$
 ? Naive answer: like a disc, $\log(\mathcal{D})$ Answer: it depends!

There is an **m** dimensional manifold of ground states: the E.E. depends continuously on the state

$$S(c_i) = S[\sum_{a=1}^{\mathfrak{m}} c_a |a\rangle]$$



Minimally entangled states



There is a special basis $\{|a
angle\}$

which are local minima of entanglement; in this basis

$$S_a = \alpha L - \log(\mathcal{D}) + \log(d_a)$$

 $|a\rangle \leftrightarrow \text{anyon types}$

[experts: subtle when [Tx,Ty] PSGs]

The minimally entangled states have "definite topological flux threading the cylinder"



What does this mean?

A more physical picture





(unitary operators in ground state manifold)

```
\mathcal{F}^c_x separate car{c} pair out to infinity
```

A more physical picture of MES

Statistics

 $\mathcal{F}_y^b \mathcal{F}_x^c = \frac{S_{bc}}{S_{b1}} \mathcal{F}_x^c \mathcal{F}_y^b:$

Fusion $\mathcal{F}^b_{x/y}\mathcal{F}^c_{x/y} \propto \mathcal{F}^{b \cdot c}_{x/y}, \quad b \cdot c = \sum_d N^d_{bc} d$





 \mathcal{F}_x^c

This algebra *requires* an **M** dimensional representation: **GSD**

a)

A more physical picture of MES a)



$$\mathcal{F}_x^b \ket{a} = \ket{b \cdot a}$$
 Permutes MES
 $\mathcal{F}_y^b \ket{a} = \ket{a} \cdot \frac{S_{ba}}{S_{b1}}$ Diagonal in MES

Unless you try really hard DMRG always produces MES basis (for two reasons...)

Example: MES of the Kagome Heisenberg Model



[from Yan, Hus & White 2010]

S = 3/2 per unit cell: H.O.L.S.M.A. says either

[Lieb, Schultz & Mattis 1961; Oshikawa 2000; Hastings 2003]

- SSB (not seen in dmrg)
 Gapless (DMRG gap = 0.05 J)
- 3. Topologically ordered



What type of topological order?

Kagome TEE



$$S_E = \alpha L - \log(\mathcal{D})$$







Jiang, et al. Nature 2012



Enumerate all TQFTs with T-reversal & $\mathcal{D} \leq \sqrt{5}$

Two contenders: **Z2 gauge theory** or **double semion**

Both have $\gamma = \log(2)$; close to numerics

Double semion impossible for subtle symmetry reasons [Zaletel & Vishwanath 2014]

Seems like Z_2 Gauge-Theory (toric code) - just like we've heard about this week!

$$\begin{array}{l} \{1,e,m,em\} \Leftrightarrow \{1,b,v,f\} \\ & \text{Bosonic spinon (b)} \\ & \text{Vison (v)} \\ & \text{Fermionic spinon (f = v b)} \end{array}$$




 $\cdots \left(\begin{array}{c} \\ \end{array} \right) \stackrel{A}{} \stackrel{B}{} \right) \cdot \left(\left| \Psi \right\rangle \right) = \sum \lambda_{\alpha} \left| \alpha \right\rangle_{A} \left| \alpha \right\rangle_{B}$

 $\hat{S}^{z}\left|\alpha\right\rangle_{A}=S_{\alpha}^{z}\left|\alpha\right\rangle_{A}$

$$\hat{T}^{y}\left|\alpha\right\rangle_{A}=e^{ik_{\alpha}}\left|\alpha\right\rangle_{A}$$

bosonic or fermionic spinon (S = 1/2)

Which is bosonic spinon, and which is fermionic?





The "topological spin" $e^{2\pi i h_a}$

Mutual statistics of b / f the same. Need to examine:



Bosonic spinon: $1 = e^{i \cdot 0}$ Fermionic spinon: $-1 = e^{i \cdot \pi}$

"Momentum polarization"

[Zaletel, Mong & Pollmann 2012; Tu, Zhang, Qi 2012]



Take "thermal average" of the momentum quantum #s:

$$e^{2\pi i h_a - \eta L_y^2} = \left[\sum_{\alpha} \lambda_{\alpha}^2 e^{ik_{\alpha}}\right]^{L_y}$$

The topological spin!

[Details for Z_2 spin liquid in Zaletel, Lu & Vishwanath]





More to say... once you know MES & topo order you can find "SET" order: the projective symmetry group



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Thanks!