when does it work?

measuring bipartite entanglement S: reduced density matrix



$$\begin{aligned} |\psi\rangle &= \sum_{ij} \psi_{ij} |i\rangle |j\rangle \quad \hat{\rho} = |\psi\rangle \langle \psi| \to \hat{\rho}_A = \mathrm{tr}_B \hat{\rho} \\ S &= -\mathrm{tr} \, \hat{\rho}_A \ln \hat{\rho}_A = -\sum_{\alpha} w_{\alpha} \ln w_{\alpha} \end{aligned}$$

arbitrary bipartition of MPS:

$|\psi\rangle = \sum \sqrt{w_{\alpha}} \alpha_A \langle \alpha_B \rangle$ use Schmidt decomposition

reduced density matrix and bipartite entanglement

$$\hat{\rho}_A = \sum_{\alpha} w_{\alpha} |\alpha_A\rangle \langle \alpha_A |$$

$$S = -\sum_{\alpha}^{D} w_{\alpha} \ln w_{\alpha} \le \ln D$$

codable maximum

why DMRG loves one dimension

Latorre, Rico, Vidal, Kitaev (03)



Hilbert space size: just an illusion?

- random state in Hilbert space: entanglement entropy extensive
- expectation value for entanglement entropy extensive and maximal
- states with non-extensive entanglement set of measure zero
- but contain ground states!
- MPS parametrize
 low-entanglement
 states efficiently!

ground states are here!



frustrated magnetism in 2D

"classic" candidates (spin length 1/2):

Yan et al, Science (2011) Depenbrock et al, PRL (2012)





DMRG in two dimensions

map 2D lattice to ID (vertical) "snake" with long-ranged interactions



horizontally: ansatz obeys area law: easy axis, long at linear cost

vertically: ansatz violates area law: hard axis, long at exponential cost

consider long cylinders of small circumference c: mixed BC



ground state energies

- fully SU(2) invariant DMRG code
- \square up to 3,800 representatives (16,000 U(I) DMRG states)
- cylinders up to circumference c=17.3, N=726

Tori up to $N=(6\times6)\times3=108$ sites

100% increase 50% increase





- TD limit energy estimate: -0.4386(5)
- iDMRG (infinite cylinder) upper bounds below HVBC; YC8: -0.4379 iDMRG: I.P. McCulloch, arXiv:0804.2509

triplet gap

■ fully SU(2) invariant DMRG code

eliminates need for special edge manipulations of U(I) DMRG: ground state of S=I sector



bond energy deviations from mean

- bulk excitation
- much smoother gap curve
- triplet gap estimate: 0.13(1)



triplet gap for infinitely long cylinders

singlet gap estimate: approx 0.05 (Yan *et al.* (2011))

TEE in the kagome lattice



TEE extracted from random state in GS manifold lower bound
 true value for so-called minimum entropy state
 DMRG seems to systematically pick those
 Zhang, Grover, Turner, Oshikawa, Vishvanath, PRB (2012)

time evolution

time-evolution

assume initial state in MPS representation; time evolution:

$$|\psi(t)\rangle = \mathrm{e}^{-\mathrm{i}\hat{H}t}|\psi(0)\rangle$$

how to express the evolution operator as an MPO?

one solution: Trotterization of evolution operator into small time steps

$$\begin{split} N \to \infty & \tau \to 0 \qquad N\tau = T \qquad \tau \sim 0.05 \\ \text{Heisenberg model:} \quad \hat{H} = \sum_{i=1}^{L-1} \hat{h}_i \qquad \hat{h}_i = \mathbf{S}_i \cdot \mathbf{S}_{i+1} \\ e^{-i\hat{H}T} = \prod_{i=1}^{N} e^{-i\hat{H}\tau} = \prod_{k=1}^{N} e^{-i\sum_{i=1}^{L-1} \hat{h}_i \tau} \stackrel{!}{=} \prod_{k=1}^{N} \prod_{i=1}^{L-1} e^{-i\hat{h}_i \tau} \end{split}$$

first-order Trotter decomposition

Trotter decomposition

calculation of $e^{-i\hat{h}_i\tau}$ as $(d^2 \times d^2)$ matrix:

 $H_i U = U\Lambda$ $H_i = U\Lambda U^{\dagger} \Rightarrow e^{-iH_i\tau} = Ue^{-i\Lambda\tau}U^{\dagger} = U \cdot \operatorname{diag}(e^{-i\lambda_1\tau}, e^{-i\lambda_2\tau}, \ldots) \cdot U^{\dagger}$

problem: exponential does not factorize if operators do not commute

$$e^{\hat{A}+\hat{B}} = e^{\hat{A}}e^{\hat{B}}e^{\frac{1}{2}[\hat{A},\hat{B}]}$$

but error is negligible as $\tau \to 0$

$$[\hat{h}_i \tau, \hat{h}_{i+1} \tau] \propto \tau^2$$

convenient rearrangement:

$$\hat{H} = \hat{H}_{\text{odd}} + \hat{H}_{\text{even}}; \qquad \hat{H}_{\text{odd}} = \sum_{i} \hat{h}_{2i-1}, \quad \hat{H}_{\text{even}} = \sum_{i} \hat{h}_{2i}$$
$$e^{-i\hat{H}_{\text{even}}\tau} e^{-i\hat{H}_{\text{odd}}\tau}; \qquad e^{-i\hat{H}_{\text{even}}\tau} = \prod_{i}^{i} e^{-i\hat{h}_{2i}\tau}, \quad e^{-i\hat{H}_{\text{odd}}\tau} = \prod_{i}^{i} e^{-i\hat{h}_{2i}\tau}$$

tDMRG, tMPS, TEBD

bring local evolution operator into MPO form:

 $U^{\sigma_1 \sigma_2, \sigma'_1 \sigma'_2} = \langle \sigma_1 \sigma_2 | \mathrm{e}^{-\mathrm{i} h_1 \tau} | \sigma'_1 \sigma'_2 \rangle$ $\overline{U}_{\sigma_1\sigma_1',\sigma_2\sigma_2'} \stackrel{SVD}{=} \sum_b W_{\sigma_1\sigma_1',b} S_{b,b} W_{b,\sigma_2\sigma_2'}$ $U^{\sigma_1\sigma_2,\sigma'_1\sigma'_2} =$ $\sum_{I} M_{1,b}^{\sigma_1 \sigma_1'} M_{b,1}^{\sigma_2 \sigma_2'}$ even bonds one time step: dimension grows as d^2 odd bonds initial state

apply one infinitesimal time step in MPO form

compress resulting MPS

single-particle excitation

- \square quarter-filled Hubbard chain: U/t=4
- add spin-up electron at chain center at time=0

measure charge and spin density



separation of charge and spin

Kollath, US, Zwerger, PRL 95, 176401 ('05)

ground states can be obtained by imaginary time evolution (SLOW!):

$$|\psi\rangle = \sum_{n} c_n |n\rangle \qquad \hat{H}|n\rangle = E_n |n\rangle \qquad E_0 \le E_1 \le E_2 \le \dots$$

$$\lim_{\beta \to \infty} e^{-\beta \hat{H}} |\psi\rangle = \lim_{\beta \to \infty} \sum_{n} e^{-\beta E_{n}} c_{n} |n\rangle = \lim_{\beta \to \infty} e^{-\beta E_{0}} (c_{0}|0\rangle + \sum_{n>0} e^{-\beta (E_{n} - E_{0})} c_{n} |n\rangle$$
$$= \lim_{\beta \to \infty} e^{-\beta E_{0}} c_{0} |0\rangle$$

real time evolution limited by entanglement growth:

$$S(t) \le S(0) + \nu t$$
 $D \sim e^S \sim e^{\nu t}$

in the worst case, matrix dimensions grow exponentially!

limitations ...

■ do correlations in non-relativistic systems spread at finite velocity? $\|[A_0(0), B_d(t)]\| \le cst. \|A\| \|B\| \exp[-(d - vt)]$

correlations

Lieb-Robinson theorem (CMP, 1972)

entanglement bound:

$$S(t) \le S(0) + cst. \times 2vt$$

linear in time exponential resources



out-of-equilibrium cartoon:

quasiparticles entangle in "light" cone

Calabrese, Cardy (since 2004) and others

dynamical quantum simulator

coherent dynamics! controlled preparation? local measurements?

first experiments:

period-2 superlattice

- double-well formation
- staggered potential bias

- pattern loading
- odd/even resolved measurement

(Fölling et al. (2007))



first theory proposals:

- prepare $|\psi
 angle = |1,0,1,0,1,0,\ldots
 angle$
- switch off superlattice
- observe Bose-Hubbard dynamics

Cramer et al., PRL 101, 063001 (2008) Flesch et al., PRA 78, 033608 (2008)

dynamical quantum simulator



Trotzky et al., Nat. Phys. 8, 325(2012)





45,000 atoms, U=5.2 momentum distribution

densities: relaxing to n=0.5



no free fit þarameters!

fully controlled relaxation in closed quantum system!

validation of **dynamical** quantum simulator

time range of experiment > 10 x time range of theory real ,,analog computer" that goes beyond theory

nearest-neighbour correlators



currents

measurement: split in double wells, measure well oscillations

0 <u>~</u> e-0



 $0 - e \wedge 0$



phase and amplitude

е

0

е

е



nearest neighbour correlations



momentum distribution

visibility proportional to nearest neighbour correlations



general trend, I/U correct!

build-up of quantum coherence



long-time limit of nearest-neighbor correlations (here: visibility of momentum distribution)

discrepancy because original theory ignored trap:



measurement at ..long time"

old theory prediction for long times without trap

trap allows particle migration to the "edges" energy gained in kinetic energy:

external potential

$$E_{kin} = -J\langle b_i^{\dagger}b_{i+1} + b_{i+1}^{\dagger}b_i \rangle$$

new: we do even better!

Barthel, US, Sachdev, 1212.3570 (2012); Barthel, 1301.2246 (2013)

$$\langle \hat{B}(2t)\hat{A}\rangle_{\beta} = Z(\beta)^{-1} \operatorname{Tr}\left(\left[\mathrm{e}^{\mathrm{i}\hat{H}t} \mathrm{e}^{-\beta\hat{H}/2} \hat{B} \mathrm{e}^{-\mathrm{i}\hat{H}t} \right] \left[\mathrm{e}^{-\mathrm{i}\hat{H}t} \hat{A} \mathrm{e}^{-\beta\hat{H}/2} \mathrm{e}^{\mathrm{i}\hat{H}t} \right] \right)$$

• one calculation if $\hat{B}^{\dagger} = \hat{A}$

doubles reachable time for same effort as in Karrasch scheme



neutron scattering at T>0



structure function by neutron scattering (Broholm group)

high flux

precise lineshapes

- problem: experiment usually T=4.2K, energy scales at J=O(10K) definitely not at T=0!
- desired feature because of achievable field strengths:
 H should be of order J --- rule of thumb IK=IT

finite-temperature dynamics

purification

density matrix of physical system: pure state of physical system plus auxiliary system

$$\hat{\rho}_{phys} = \text{Tr}_{aux} |\psi\rangle \langle \psi|$$



finite-temperature dynamics

evolution of pure state in enlarged state space

Verstraete, Garcia-Ripoll, Cirac, PRL '04

purification and finite-T evolution

purification: any mixed state can be expressed by a pure state on a larger system (P: physical, Q: auxiliary state space)

$$\hat{
ho}_P = \sum_n
ho_n |n
angle_P \ _P \langle n| \qquad |\psi
angle_{PQ} = \sum_n \sqrt{
ho_n} |n
angle_P |n
angle_Q$$
 $\hat{
ho}_P = \operatorname{tr}_Q |\psi
angle_{PQ} \ _P Q \langle \psi| \qquad \text{simplest way: Q copy of P}$

expectation values as before:

$$\langle \hat{O}_P \rangle_{\hat{\rho}_P} = \mathrm{tr}_P \hat{O}_P \hat{\rho}_P = \mathrm{tr}_P \hat{O}_P \mathrm{tr}_Q |\psi\rangle_{PQ} \ _{PQ} \langle \psi | = \mathrm{tr}_{PQ} \hat{O}_P |\psi\rangle_{PQ} \ _{PQ} \langle \psi | = \ _{PQ} \langle \psi | \hat{O}_P |\psi\rangle_{PQ}$$

time evolution as before:

$$\hat{\rho}_P(t) = \mathrm{e}^{-\mathrm{i}\hat{H}t}\hat{\rho}_P \mathrm{e}^{+\mathrm{i}\hat{H}t} = \mathrm{e}^{-\mathrm{i}\hat{H}t}\mathrm{tr}_Q|\psi\rangle_{PQ} \ _{PQ}\langle\psi|\mathrm{e}^{+\mathrm{i}\hat{H}t} = \mathrm{tr}_Q|\psi(t)\rangle_{PQ} \ _{PQ}\langle\psi(t)|$$

$$|\psi(t)\rangle_{PQ} = \mathrm{e}^{-\mathrm{i}\hat{H}t}|\psi\rangle_{PQ}$$

time-evolution of thermal states

problem: usually we do not have mixed state in eigenrepresentation

thermal states: easy way out by imaginary t-evolution

$$\mathrm{e}^{-\beta\hat{H}} = \mathrm{e}^{-\beta\hat{H}/2} \cdot \hat{I}_P \cdot \mathrm{e}^{-\beta\hat{H}/2} = \mathrm{tr}_Q \mathrm{e}^{-\beta\hat{H}/2} |\rho_0\rangle_{PQ PQ Q} \langle\rho_0|\mathrm{e}^{-\beta\hat{H}/2}$$

purification of infinite-T state: product of local totally mixed states gauge degree of freedom: arbitrary unitary evolution on Q

lots of room for improvement: see further slides!!



linear prediction

(Barthel, Schollwöck, White, PRB 79, 245101 (2009))

 \square ansatz: data is linear combination of *p* previous data points



find prediction coefficients by minimising error for available data

$$E = \sum_{n} \frac{|\tilde{x}_n - x_n|^2}{w_n}$$
 error estimate

iteratively continue time series from data using ansatz

linear prediction

(Barthel, US, White, PRB 79, 245101 (2009))

 \blacksquare ansatz: data is linear combination of p previous data points



find prediction coefficients by minimising error for available data

$$E = \sum_{n} \frac{|\tilde{x}_n - x_n|^2}{w_n} \text{ error estimate}$$
$$0 = \sum_{j} a_j \sum_{n \in \mathcal{N}_{fit}} \frac{x_{n-k}^* x_{n-j}}{w_n} + \sum_{n \in \mathcal{N}_{fit}} \frac{x_{n-k}^* x_n}{w_n}$$

linear prediction II

solving for the coefficients: matrix equation

$$\mathbf{R} \cdot \mathbf{a} = -\mathbf{r} \qquad \qquad R_{ij} = \sum_{n \in \mathcal{N}_{fit}} \frac{x_{n-i}^* x_{n-j}}{w_n}$$
$$\mathbf{a} = -\mathbf{R}^{-1} \cdot \mathbf{r} \qquad \qquad r_i = \sum_{n \in \mathcal{N}_{fit}} \frac{x_{n-i}^* x_n}{w_n}$$

attention: close to singular!

iterating the solution towards the future

$$\mathbf{x}_n = [x_{n-1} \dots x_{n_p}]^T \qquad \mathbf{A} = \begin{bmatrix} -a_1 & -a_2 & \dots & -a_P \\ 1 & 0 & & \\ 0 & 1 & \ddots & \\ & \ddots & \ddots & 0 \\ & & 0 & 1 \end{bmatrix}$$

transverse Ising model

cuts in momentum space: time domain

cuts in momentum space: frequency domain



extends time domain 10x

k=pi/4 k=pi/2 k=3pi/4

spin-1/2 Heisenberg chain

structure function at finite T in real space and time



spinonic continuum of excitations: much harder!?

 $(\pi/2)|\sin k| \le \omega(k) \le \pi \sin k/2$ at T=0

spin-1/2 Heisenberg chain II

dependence on prediction parameters negligible





excellent convergence to Bethe ansatz (98%)



when does it work?

why do we predict S(k,t) in time and not e.g. G(x,t) (and Fourier transform to momentum space later)?

linear prediction works best for special time series

superposition of exponential decays

$$x_{n+m} = \sum_{\nu=1}^{p} c_{\nu} e^{i(\omega_{\nu} - \eta_{\nu})m} x_{n}$$

cf. pole structure of momentum-space of Green's functions

$$G(k,\omega) = \frac{1}{\omega - \epsilon_k - \Sigma(k,\omega)} \qquad G(k,t) = a_1 e^{-i\omega_1 t - \eta_1 t}$$

evolution of the auxiliary system

problem: sometimes results are not good enough even using prediction

time-evolve Q using physical Hamiltonian backwards in time

substantial improvement over original approach

questions:

- why does time range improve?
- can we do even better?

a new notation

- isomorphism between ,,doubled" Hilbert space and linear bounded operators on Hilbert space $\begin{array}{l}\mathcal{H}_P = \mathcal{H}_Q \equiv \mathcal{H}\\ |\psi\rangle \in \mathcal{H} \otimes \mathcal{H} \qquad \hat{\Psi} \in \mathcal{B}(\mathcal{H}) : \mathcal{H} \mapsto \mathcal{H}\\ \langle \{\sigma\}, \{\sigma'\} |\psi\rangle \equiv \langle \{\sigma\} | \hat{\Psi} | \{\sigma'\} \rangle\end{array}$
- in MPS language:

matrix product operator

$$|\psi\rangle = \sum_{\{\sigma\},\{\sigma'\}} A^{\sigma_1,\sigma'_1} \dots A^{\sigma_L,\sigma'_L} |\{\sigma\},\{\sigma'\}\rangle \qquad \qquad \hat{\Psi} = \sum_{\{\sigma\},\{\sigma'\}} A^{\sigma_1,\sigma'_1} \dots A^{\sigma_L,\sigma'_L} |\{\sigma\}\rangle \langle\{\sigma'\}|$$

translation rules: $\begin{aligned} |\psi(0)\rangle \propto \sum_{\{\sigma\},\{\sigma'\}} |\{\sigma\},\{\sigma'\}\rangle \equiv |I\rangle & \hat{I} \\ |\psi(\beta)\rangle \propto e^{-\beta\hat{H}}|I\rangle & e^{-\beta\hat{H}} \\ (\hat{P} \otimes \hat{Q})|\psi\rangle \leftrightarrow \hat{P}\hat{\Psi}\hat{Q}^{T} \end{aligned}$



reexpress approaches ...

$$\langle \hat{B}(t)\hat{A}\rangle_{\beta} = Z(\beta)^{-1} \langle I|\mathrm{e}^{-\beta\hat{H}/2}\mathrm{e}^{\mathrm{i}\hat{H}t}\hat{B}\mathrm{e}^{-\mathrm{i}\hat{H}t}\hat{A}\mathrm{e}^{-\beta\hat{H}/2}|I\rangle$$

original approach:

matrix product operator

$$\langle \hat{B}(t)\hat{A}\rangle_{\beta} = Z(\beta)^{-1} \operatorname{Tr}\left(\left[e^{-\beta \hat{H}/2} e^{+i\hat{H}t} \right] \hat{B} \left[e^{-i\hat{H}t} \hat{A} e^{-\beta \hat{H}/2} \right] \right)$$

approach by Karrasch et al.:



long-ranged interactions

what can we do if interactions are not just nearest-neighbour?

larger unit cells for Trotter scheme

becomes very costly

swap gates + Trotter scheme

treat all interactions as nearest-neighbour

to make this possible you have to swap sites into different positions

sequence of nearest-neighbour swaps

build one large M-matrix from two sites, exchange local sites, deconstruct into two M-matrices by SVD

long-ranged interaction: Krylov

- bring Hamiltonian into MPO form: exact, small dimension
- calculate successive powers $|\psi\rangle, H|\psi\rangle, H^2|\psi\rangle, \dots$ Krylov vectors
 - apply Hamiltonian MPO
 - compress resulting MPS
- orthonormalize powers



- \blacksquare tridiagonalize Hamiltonian in new basis, calculate $e^{iH\Delta t}|\psi
 angle$
- for small time steps, 4 to 5 Krylov vectors sufficient; quasi-exact

conclusions

ID: DMRG/MPS currently most powerful method

ground states

time-evolution, also at non-zero temperature

limitation: exponential growth of resources; entanglement growth

2D: DMRG/MPS starts making very interesting forays

long cylinders

suboptimal ansatz, but numerically extremely stable

barring new ideas, key challenges for powerful codes:

parallelization

(non-)Abelian quantum numbers

non-trivial geometries (impurity solvers, quantum chemistry)

convergence of ground states