

Free fermion entanglement renormalization from wavelets

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CMT seminar, UvA, April 2018

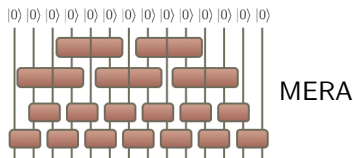
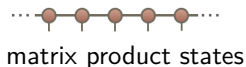
joint work with Haegeman, Swingle, Cotler, Evenbly, Scholz (arXiv:1707.06243)
& with Scholz, Swingle, Witteveen (forthcoming)

Tensor network states

Efficient variational classes for many-body quantum systems:

$$|\Psi\rangle = \sum_{i_1, \dots, i_n} \Psi_{i_1, \dots, i_n} |i_1, \dots, i_n\rangle$$

e.g.



- ▶ can have interpretation as **quantum circuit**

Useful theoretical formalism:

- ▶ geometrize **entanglement structure**: *generalized area law*
- ▶ bulk-boundary **dualities**: *lift physics to the virtual level*
- ▶ quantum phases, topological order, RG, holography, ...

Tensor networks and quantum field theories

- ▶ tensor networks are **discrete** and **finite** representations
- ▶ quantum field theories are **infinite** and defined in the **continuum**

Two successful approaches:

- ▶ *Lattice*: MPS, PEPS, MERA, ...
- ▶ *Continuum*: cMPS, cMERA, ...

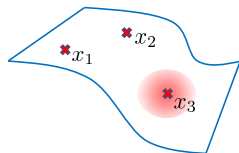
Guiding questions:

- ▶ *How to measure goodness of approximation?*
- ▶ *What do tensor networks really capture?*
- ▶ *Why do tensor networks work so well?*

Tensor networks for correlation functions

Given many-body system in state ρ and choice of operators $\{O_\alpha\}$, define **correlation function**:

$$C(\alpha_1, \dots, \alpha_n) = \text{tr}[\rho O_{\alpha_1} \cdots O_{\alpha_n}]$$



Goal: Design tensor network for correlation functions!

- ▶ unified perspective: system can be continuous, discreteness imposed by how we probe it
- ▶ tensor network for state sufficient, but likely not optimal
- ▶ in lattice models can recover state, but *only* for complete set of $\{O_\alpha\}$

Examples: Zaletel-Mong (MPS/q. Hall states), König-Scholz (MPS/CFTs),
cf. **quantum marginal problem**

Our results

We construct tensor networks for **free fermion systems**:

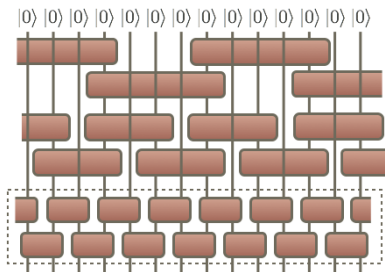
- ▶ 1D Dirac fermions on lattice & continuum
- ▶ non-relativistic 2D fermions on lattice (Fermi surface)

Key features:

- ▶ tensor networks that target **correlation functions**
- ▶ **rigorous** approximation guarantees
- ▶ **quantum circuits** that 'renormalize entanglement': (branching) MERA
- ▶ **explicit** circuit construction, no variational optimization required

We achieve this using insight from signal processing: **wavelet theory**.

MERA: multi-scale entanglement renormalization ansatz (Vidal)



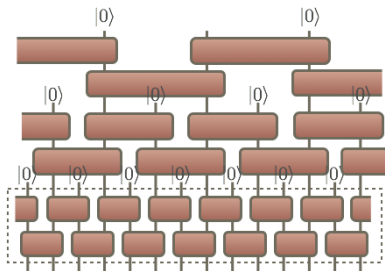
↓ local quantum circuit that prepares state from $|0\rangle^{\otimes N}$

↑ entanglement renormalization

↕ organize q. information by scale

- ▶ layers are short-depth quantum circuits (disentangle & coarse-grain)
- ▶ variational class for critical systems in 1D
- ▶ any MERA can be extended to a 'holographic' mapping
- ▶ reminiscent of holography (Swingle), starting point for tensor network models (HaPPY; Hayden-...-W.)

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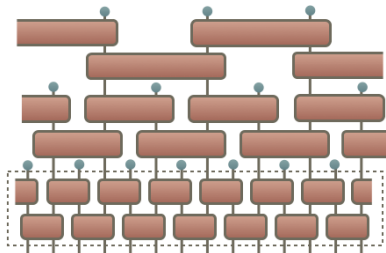
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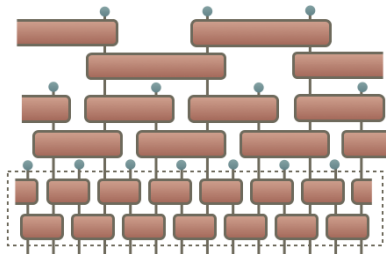
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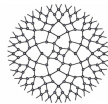


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Wavelet transforms

Wavelet transforms locally resolve **classical signal** into different scales:

$$V_0 = \frac{1}{2} W_0 + \frac{1}{2} V_1$$

- ▶ $V_j = \{\text{signals at scale } \geq j\}$, $W_j = \{\text{signals at scale } j\}$

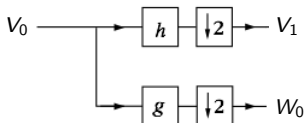
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Discrete wavelet transform (DWT): corresponding basis transformation



- ▶ defined by convolution with low-pass filter h and high-pass filter g

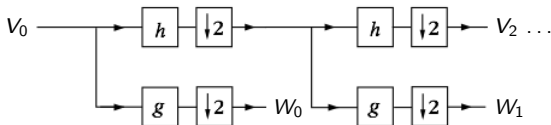
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The diagram illustrates the decomposition of a signal V_0 into three components. On the left, a green square pulse is labeled V_0 . This pulse is equal to the sum of three other pulses: $\frac{1}{2} W_0$, $\frac{1}{4} W_1$, and $\frac{1}{4} V_2$. The pulse W_0 is a wider square pulse with a height of $\frac{1}{2}$. The pulse W_1 is a square pulse with a height of $\frac{1}{4}$ and a width that is half of W_0 . The pulse V_2 is a square pulse with a height of $\frac{1}{4}$ and a width that is a quarter of V_0 .

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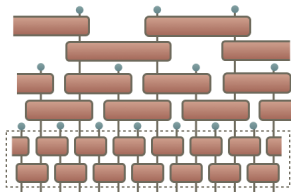
Discrete wavelet transform (DWT): corresponding basis transformation



- ▶ defined by convolution with low-pass filter h and high-pass filter g
- ▶ **local** and **recursive**, resolves discrete input signal into different scales

MERA and wavelets

Key insight: Second quantizing 1D wavelet transform \leadsto MERA circuit!



- ▶ in fact, obtain 'holographic' mapping (Q_i)
- ▶ length of classical filter $\hat{=}$ depth of quantum circuit (Evenbly-White)

Ansatz: To construct free-fermion ground states, design wavelet transforms that target positive/negative energy modes.

1D Dirac fermions – Lattice model and result

Massless ‘staggered’ Dirac fermions on 1D lattice (Kogut-Susskind):

$$H_{1D} = -\sum_n a_n^\dagger a_{n+1} + h.c. \cong -\sum_n b_{1,n}^\dagger b_{2,n} - b_{2,n}^\dagger b_{1,n+1} + h.c.$$

- ▶ easily solved using Fourier transform – but *not* a local q. circuit!

We construct MERA networks that target correlation functions:

$$C(\{f_i\}) := \langle b_{j_1}^\dagger(f_1) \cdots b_{j_{2N}}(f_{2N}) \rangle$$

Result (simplified)

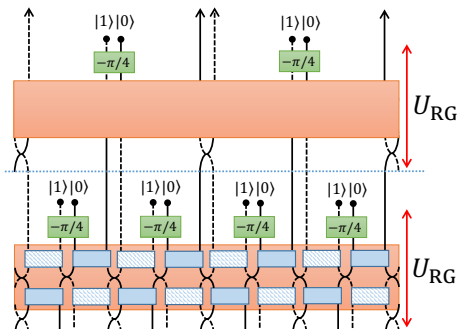
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- ▶ negative/positive energy modes on sublattices are related by $\mp i \text{sign}(k) e^{ik/2}$. can choose *any* basis of Fermi sea...

Task: Engineer **pair** of wavelet transforms that target this phase relation

- ▶ studied in signal processing, motivated by *translation-invariance* (!)
- ▶ impossible exactly, but possible to arbitrary accuracy (Selesnick)

1D Dirac fermions – Ground state and wavelets

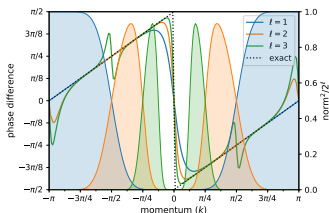
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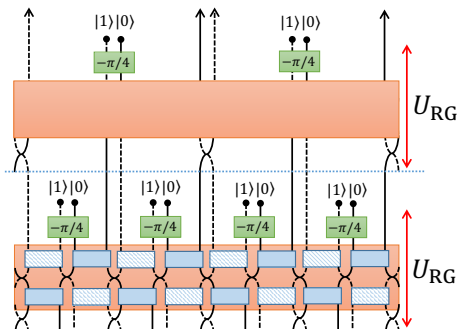
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1D Dirac fermions – MERA



Parameters:

- ▶ \mathcal{L} – number of layers
- ▶ ε – accuracy of phase relation of filters
- ▶ W – ‘size’ of filters/ ‘depth’ per layer ($\varepsilon \sim c^{-W}$)

Consider **correlation function** of N creation and annihilation operators

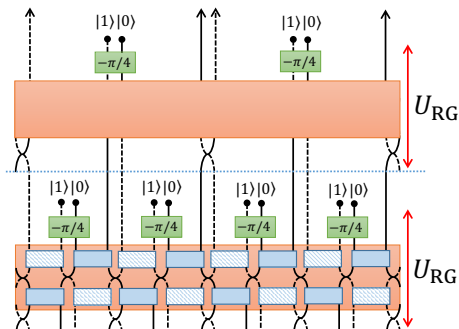
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supported on S lattice sites.

Result (simplified)

$$|C(\{f_i\})_{\text{exact}} - C(\{f_i\})_{\text{MERA}}| \lesssim \sqrt{SNW} \max\{2^{-\mathcal{L}/4}, \varepsilon\}$$

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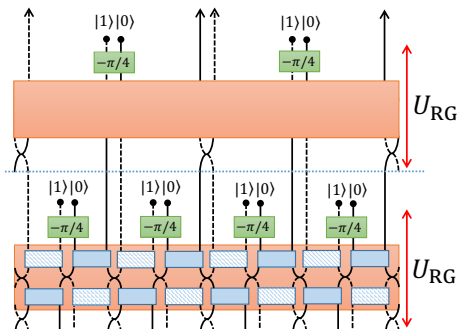
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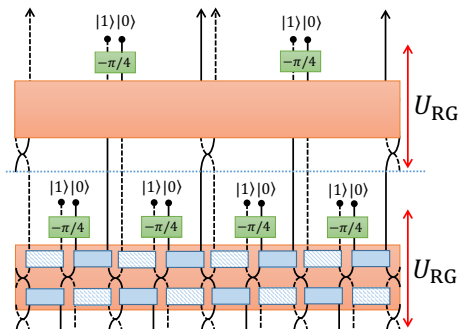
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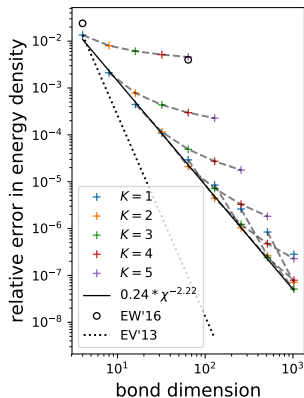
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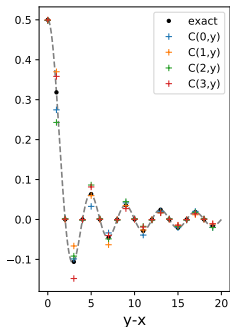
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1D Dirac fermions – Numerics

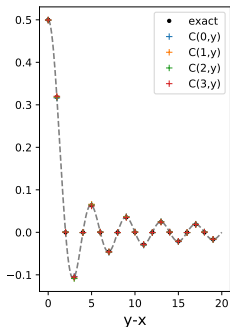
Energy error



Green's function $C(x, y) = \langle a_x^\dagger a_y \rangle$



bond dimension 2^2



bond dimension 2^6

1D Dirac fermions – Continuum

Massless Dirac fermions in (1+1)d:

$$\begin{bmatrix} i(\partial_t + \partial_x) & 0 \\ 0 & i(\partial_t - \partial_x) \end{bmatrix} \begin{bmatrix} \psi_+ \\ \psi_- \end{bmatrix} = 0$$

- ▶ need to produce modes $\psi_{\pm}(x)$ supported in $k < 0$ / $k > 0$

Natural construction: ‘Continuum limit’ of inverse wavelet transform!

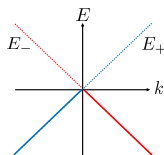
- ▶ for pair of transforms as before: outputs ψ_1, ψ_2 (wavelet functions) related by $i \operatorname{sign}(k) \rightsquigarrow \psi_{\pm} = \psi_1 \pm i\psi_2$

Result: Rigorous quantum circuits for a quantum field theory!

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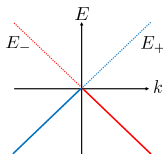
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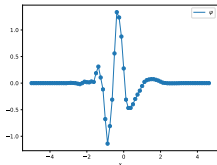
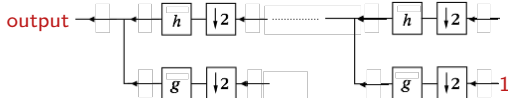
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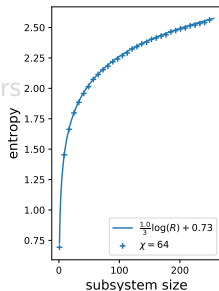


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1D Dirac fermions – Verifying conformal data

- ▶ **Central charge:** $S(R) = \frac{c}{3} \log R + c'$
- ▶ **Scaling dimensions:** usual procedure: find operators that coarse-grain to themselves (Evenly-Vidal)



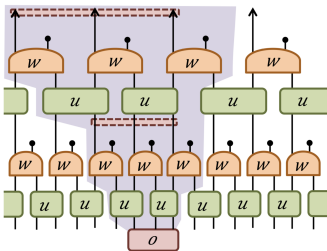
↪ diagonalize 'scaling superoperator' (eigenvalues $2^{-\Delta_\alpha}$)

Here can also simply verify scaling of two-point functions.

Similarly: OPE coefficients, q. error correction properties (Kim-Kastoryano)

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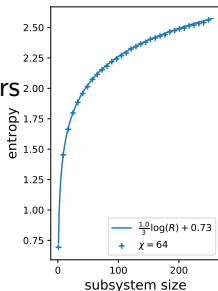
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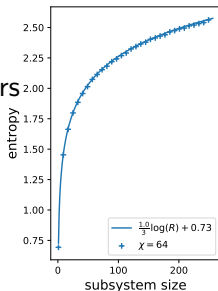
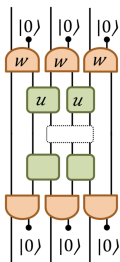
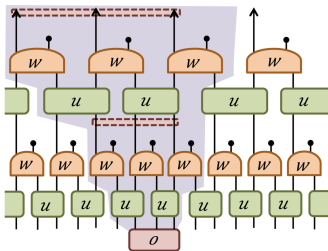
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$$H_{1D} \cong - \sum_n a_n^\dagger a_{n+1} + h.c.$$

Non-relativistic fermions hopping on 2D square lattice at half filling:

$$H_{2D} = - \sum_{m,n} a_{m,n}^\dagger a_{m+1,n} + a_{m,n}^\dagger a_{m,n+1} + h.c.$$

Fermi surface:

- ▶ violation of area law: $S(R) \sim R \log R$ (Wolf, Gioev-Klich, Swingle)
- ▶ Green's function factorizes w.r.t. rotated axes

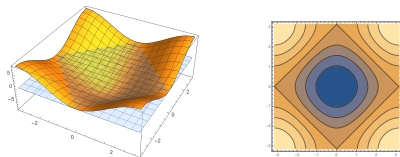
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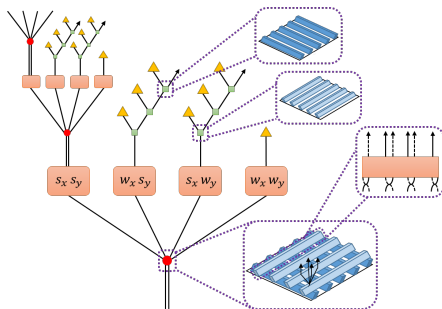
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Non-relativistic 2D fermions – Branching MERA

Natural construction: **Tensor product** of wavelet transforms!

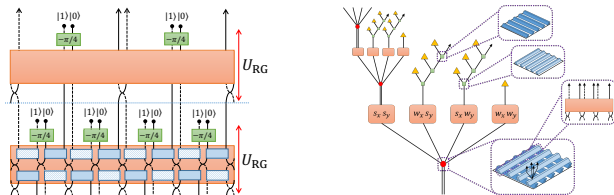
$$W\psi = \psi_s \oplus \psi_w \quad \rightsquigarrow \quad (W \otimes W)\psi = \psi_{ss} \oplus \psi_{ws} \oplus \psi_{sw} \oplus \psi_{ww}$$

After second quantization, obtain variant of **branching MERA** (Evenbly-Vidal):



Similar approximation theorem holds.

Summary and outlook



Entanglement renormalization for free fermions (lattice and continuum):

- ▶ Rigorous approximation of **correlation functions**
- ▶ Explicit quantum circuits from **wavelet** transforms

Outlook:

- ▶ Thermal states, WZW CFTs (w/ Scholz, Swingle, Witteveen), ...
- ▶ Massive theories, Dirac cones, ..., interacting theories?
- ▶ Building block? Starting point for variational optimization?

Thank you for your attention!