

Renormalization group maps for Ising models and tensor networks

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Outline

Joint work with Slava Rychkov

- ▶ Wilson-Kadanoff RG (real-space RG)
- ▶ Tensor networks
- ▶ Simple RG map for tensor network
- ▶ High temperature fixed point - stable?
- ▶ Problem : eigenvalue=1 - CDL problem
- ▶ Better RG - disentangler
- ▶ Stability of high temp fixed point
- ▶ Outlook

arXiv:2107.11464

Ask questions.

Wilson-Kadanoff RG (real space RG)

Ising type models: spins take on only values ± 1 .

Nearest neighbor interaction

$$H(\sigma) = -\beta \sum_{\langle i,j \rangle} \sigma_i \sigma_j$$

More general interaction

$$H(\sigma) = \sum_Y d(Y) \sigma(Y), \quad \sigma(Y) = \prod_{i \in Y} \sigma_i$$

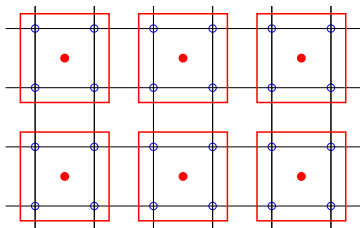
where the sum is over all finite subsets including the empty set.

Note that β has been absorbed into the Hamiltonian.

Blocking

Lattice divided into blocks; each block assigned a block spin variable.

Block spins also take on only the values ± 1 .



Wilson Kadanoff RG

Original spins: σ Block spins: $\bar{\sigma}$

RG Kernel: $T(\bar{\sigma}, \sigma)$, e.g., majority rule

Satisfies

$$\sum_{\bar{\sigma}} T(\bar{\sigma}, \sigma) = 1, \quad \forall \sigma$$

for all original spin configurations σ .

Renormalized Hamiltonian $\bar{H}(\bar{\sigma})$ is formally defined by

$$e^{-\bar{H}(\bar{\sigma})} = \sum_{\sigma} T(\bar{\sigma}, \sigma) e^{-H(\sigma)}$$

Note: β has been absorbed into the Hamiltonians.

Key point: only makes sense in finite volume.

RG maps preserves Z

$$\sum_{\bar{\sigma}} T(\bar{\sigma}, \sigma) = 1 \quad \forall \sigma, \quad e^{-\bar{H}(\bar{\sigma})} = \sum_{\sigma} T(\bar{\sigma}, \sigma) e^{-H(\sigma)}$$

$$\sum_{\bar{\sigma}} e^{-\bar{H}(\bar{\sigma})} = \sum_{\sigma} e^{-H(\sigma)}$$

So free energy of the original model can be recovered from the renormalized Hamiltonian.

Study the critical behavior of the system by studying iterations of the renormalization group map:

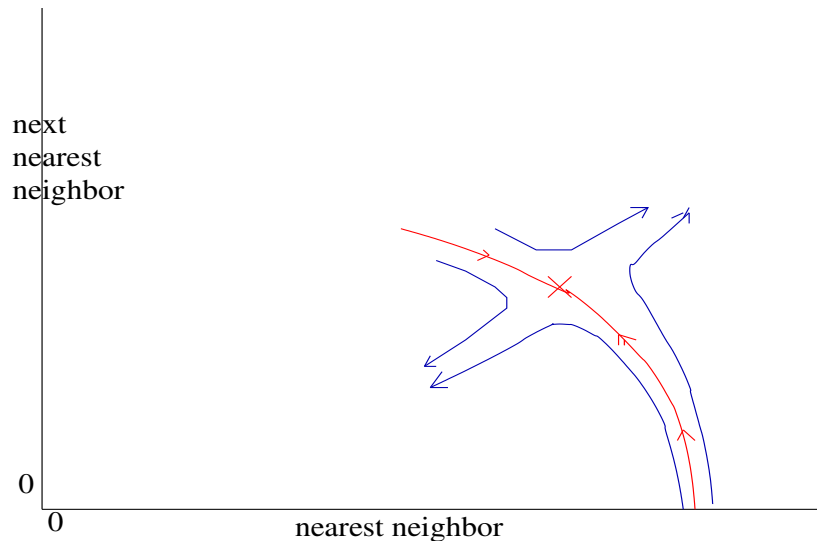
$$\mathcal{R}(H) = \bar{H}$$

Remember: \mathcal{R} is not even defined from a rigorous point of view.

RG flow

Has a fixed point with stable manifold of co-dim 2

Eigenvalues of linearization $> 1 \implies$ critical exponents



Rigorous results

Existence of map at high temp or large magnetic field

Griffiths and Pearce; Israel; Kashapov; Yin

Non-existence of map at low temp for various kernels

Griffiths and Pearce; Israel; van Enter, Fernández and Sokal

Non-existence of map near critical temp for some kernels

Essentially no results even for first iteration of the map near critical surface.

Goal: Not to determine for each T whether it works or not.
Show there is **one** T that works.

Numerical studies

Wilson (Rev. Mod. Phys. 1975) - 217 terms in H !
“A number of details are omitted.”

Lots of Monte Carlo studies using Wilson-Kadanoff RG

Swendsen: compute the linearization of the RG map from correlation functions. Avoids computing \mathcal{R} itself.

Brandt, Ron, Swendsen Saw significant dependence of \bar{H} on truncation method.

“Even though the individual multispin interactions usually have smaller coupling constants than two-spin interactions, the fact that they are very numerous can lead to multispin interactions dominating the effects of two-spin interactions.”

Lattice gas variables

RG calculations usually done using the spin variables $\sigma_i = \pm 1$.

lattice gas variables: $n_i = (1 - \sigma_i)/2$ which take on the values 0, 1.

In lattice gas variables

$$\bar{H}(\bar{n}) = \sum_Y c(Y) \bar{n}(Y), \quad \bar{n}(Y) = \prod_{i \in Y} \bar{n}_i$$

Y summed over all finite subsets of block spins

Take H to be n.n. **critical** Ising

You can compute the $c(Y)$ very accurately.

Compute them for about 10,000 Y 's.

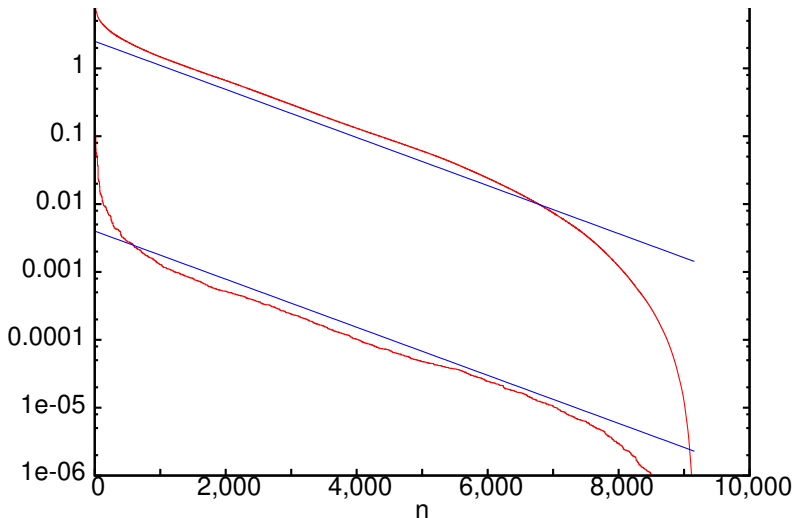
Order by decreasing $|c(Y)|$ and plot.

arXiv:0905.2601

Decay of lattice gas coefs

Bottom curve: $|c(Y_n)|$ vs. n . Top curve: $\sum_{i=n}^N |c(Y_n)|$ vs. n .

Two lines : $c2^{-n/850}$



Open problems

1. Prove there is a Banach space of Hamiltonians and a rigorously defined RG map on it which has a non-trivial fixed point with a stable manifold of co-dimension two.
2. Develop a systematic numerical approach to compute the RG map.

Tensor network

Let H be a real Hilbert space (finite or infinite dimensional)

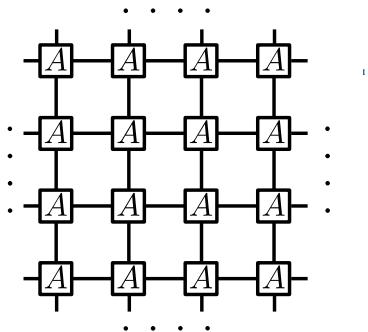
A tensor (of order 4) is a map

$$A : H \times H \times H \times H \rightarrow \mathbb{R}$$

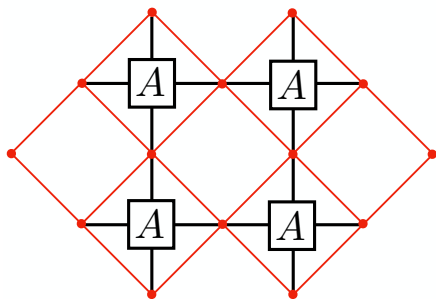
which is linear in each argument. Let e_i be o.n. basis for H .

$$A_{ijkl} = A(e_i, e_j, e_k, e_l)$$

Tensor network is formed by contracting copies of A :



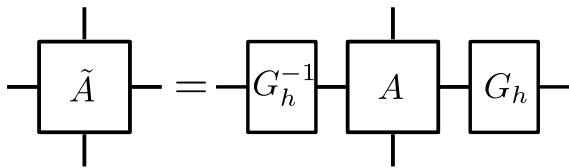
Ising model as tensor network - cond matter



$$\begin{array}{c} \sigma_2 \\ | \\ \square \\ | \\ \sigma_4 \end{array} \begin{array}{c} \sigma_3 \\ | \\ \square \\ | \\ \sigma_4 \end{array} \begin{array}{c} \sigma_1 \\ | \\ \square \\ | \\ \sigma_4 \end{array} = e^{\beta(\sigma_1\sigma_2 + \sigma_2\sigma_3 + \sigma_3\sigma_4 + \sigma_4\sigma_1)}$$

Gauge transformations

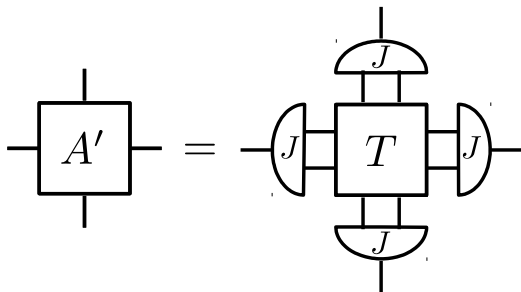
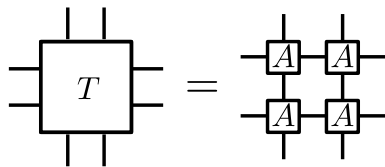
Let G_h be invertible 2-leg tensor (matrix). Define \tilde{A} by



Contraction of \tilde{A} network is same as contraction of A network.

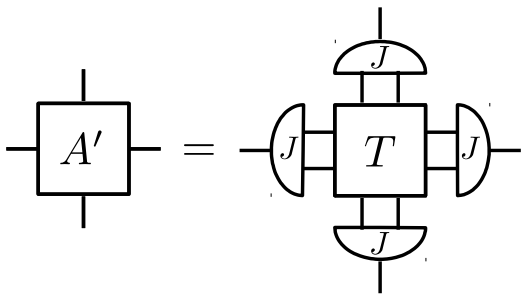
Simplest RG for tensor network

Levin, Nave (2007)



J is isometry of $H \otimes H$ onto H .

Simplest RG for tensor network



J is isometry of $H \otimes H$ onto H . Many such isometries.
This freedom is equivalent to a gauge transformation.

Wilson-Kadanoff vs tensor network RG

- ▶ *Growth of number of variables*
WK RG: Spins only have two values but Hamiltonian becomes non-local with many multi-body terms
TN RG: Tensor stays local, but leg dimension grows
- ▶ *Computability of RG map*
WK RG: no explicit way to compute it - ∞ volume limit
TN RG: Explicitly computable, but disentanglers complicate it

High temperature fixed point

Let A^{HT} be tensor with one nonzero component $A_{0000}^{HT} = 1$.

Assume $J(e_0 \otimes e_0) = e_0$. Then A^{HT} is a fixed point of RG.

$$A^{HT} = \begin{array}{c} | \\ \bullet \\ | \end{array}$$

Apply RG map:

$$\begin{array}{cc} | & | \\ \bullet & \bullet \\ | & | \end{array} = \begin{array}{ccc} & 0 & 0 \\ 0 & | & | \\ & \bullet & \bullet \\ 0 & | & | \\ & 0 & 0 \end{array}$$

$$\rightarrow \begin{array}{c} 0 \\ | \\ \bullet \\ | \\ 0 \end{array} = A^{HT}$$

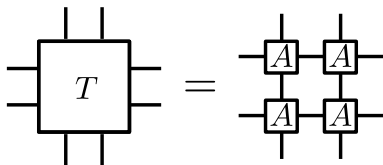
Is it stable?

Norms

Use Hilbert-Schmidt (Frobenius) norm:

$$\|A\|^2 = \sum_{ijkl} A_{ijkl}^2$$

If A, B are tensors of any order and C is formed by contracting some indices of A with some indices of B , then by Cauchy-Schwarz inequality $\|C\| \leq \|A\| \|B\|$.



$$\|T\| \leq \|A\|^4$$

CDL Problem (Corner double line)

Now perturb A^{HT} : $A = A^{HT} + \delta A$, $\|\delta A\| = O(\epsilon)$.

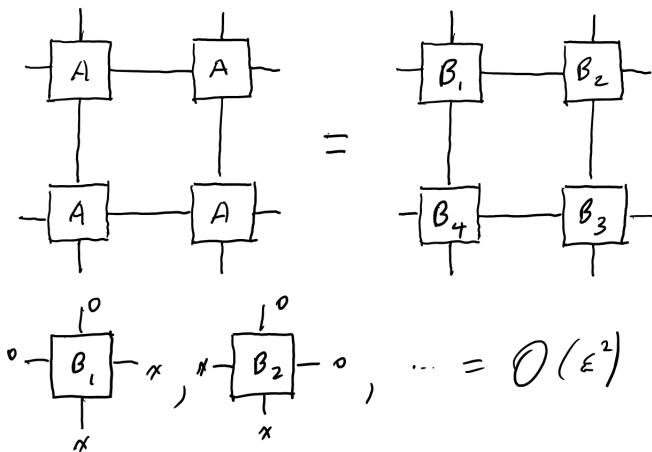
Compute A' to first order:

$$A = \begin{array}{c} \text{---} \bullet \text{---} \\ | \\ \text{HT} \end{array} + \begin{array}{c} \oplus \\ | \\ O(\epsilon) \end{array} \quad \text{Apply RG map:}$$

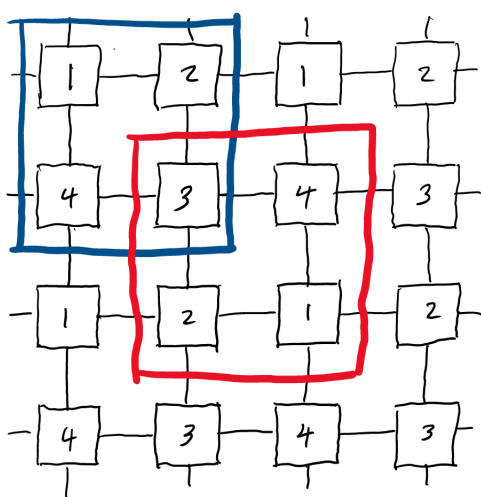
$$A' = \begin{array}{c} \bullet \bullet \\ | | \\ \bullet \bullet \end{array} + \begin{array}{c} \bullet \bullet \\ | \oplus \\ \bullet \bullet \end{array} + 3 \text{ rotations} + O(\epsilon^2)$$

$$\begin{array}{c} \bullet \bullet \\ | \oplus \\ \bullet \bullet \end{array} \rightarrow \begin{array}{c} \circ \\ | \\ \circ \oplus \\ | \\ \circ \end{array} \leftarrow \text{not contracted}$$

Disentangler



Disentangler - cont



Disentangle



Contract

Stability of high temp fixed point

Theorem:

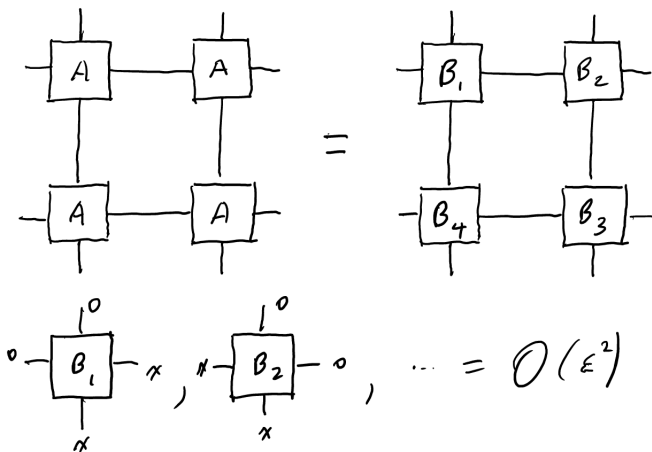
There is a tensor RG map such that if $A = A^{HT} + \delta A$ with $\|\delta A\|$ small, then the image has the form $A' = A^{HT} + \delta A'$ with

$$\|\delta A'\| \leq C\|\delta A\|^{3/2}$$

(The tensor A is normalized so that $A_{0000} = 1$ and the RG map includes a normalization step so that $A'_{0000} = 1$.)

Sketch of the proof - 1

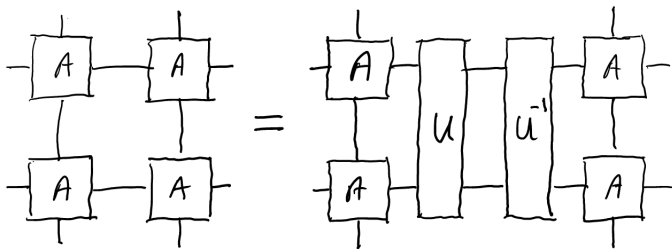
Recall the disentangler :



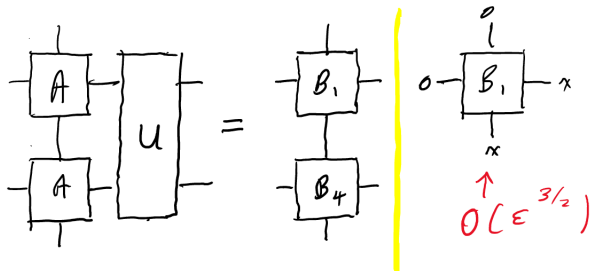
This reduces the proof to proving the existence of the disentangler.

NB: We will cheat a bit in the following - more on this later

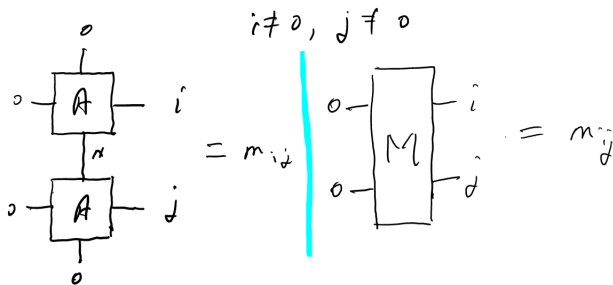
Sketch of the proof - 2



Sketch of the proof -3



Sketch of the proof -4



$$M = \sum_{i \neq 0, j \neq 0} m_{ij} |0\rangle \langle j|$$

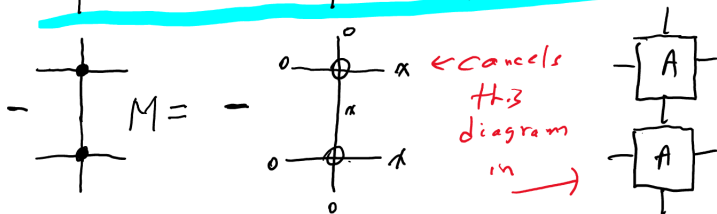
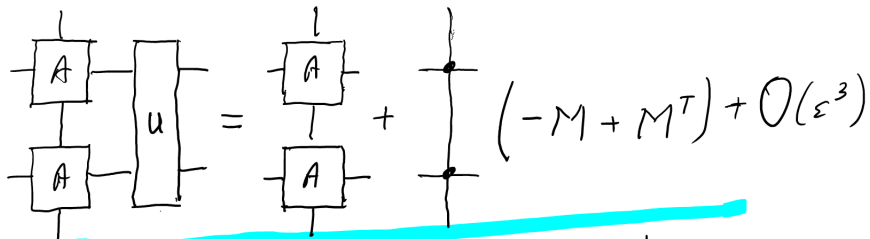
$$U = \exp(-M + M^T)$$

Note $\|M\| = O(\epsilon^2)$.

$$U = I - M + M^T + O(\epsilon^4)$$

Sketch of the proof -5

Compute to order $O(\epsilon^2)$



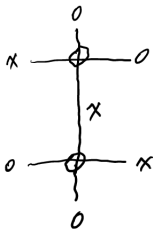
Sketch of the proof - 6

$$= \begin{array}{c} \bullet \\ | \\ \bullet \end{array} + \begin{array}{c} \circ \\ | \\ \bullet \end{array} + \begin{array}{c} \bullet \\ | \\ \circ \end{array} + \begin{array}{c} \bullet \\ | \\ \circ \\ | \\ \circ \end{array} + \begin{array}{c} \circ \\ | \\ \circ \\ | \\ \alpha \end{array} - \begin{array}{c} \circ \\ \circ \quad \alpha \\ | \\ \alpha \\ \circ \quad \alpha \\ | \\ \circ \end{array} + \mathcal{O}(\varepsilon^3)$$

$$= \begin{array}{c} \circ \\ | \\ \text{b}_1 \\ | \\ \text{b}_4 \\ | \\ \circ \end{array} + \mathcal{O}(\varepsilon^3)$$

$$\begin{array}{c} \circ \\ | \\ \text{b}_1 \\ | \\ \circ \end{array} = \begin{array}{c} \bullet \\ | \\ \bullet \end{array} + \begin{array}{c} \circ \\ | \\ \bullet \end{array}$$

Sketch of the proof - the cheat



not cancelled

not $O(\epsilon^3)$

Outlook

Presented a modest first step in rigorous study of tensor RG maps **without truncation**.

Holy grail : prove there is a RG map for tensor networks with a non-trivial fixed point.

There are many tensor RG maps that have been studied numerically. Which one is best for above?