TNSAA7: 2019.12.04

Tensor Product State (TPS) and Projected Entangled Pair State (PEPS), these terms are quite similar if the former is pronounced as T_ePS

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arXiv:1612.07611







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Model: Vectors of constant length on each site

*We consider a group of **statistical** lattice models on **square lattice**, that contain **vectors of constant length** as site variables.



*There is a variety of models according to the restriction imposed on vectors. (= condition for site degrees of freedom)

*Vectors of variable length can be considered as generalizations. ... Gaussian Model, Spherical Model, String models, etc.

Model: Vectors of constant length on each site

Interaction: Inner product between neighboring vectors

$$\mathbf{H} = -\mathbf{J} \ \mathbf{\Sigma}_{ij} \ \mathbf{V}_i \cdot \mathbf{V}_j$$

Vi is the vector of unit length on site "i". Sum is taken over all the neighboring sites denoted by "ij".

* Additional terms and modification can be considered.

External magnetic field $-\sum_i V_i \cdot h$

Next nearest neighbor interaction – J²

bi-quadratic interaction (non-linear)

generalized bilinear interaction

- J'
$$\sum_{ik} V_i \cdot V_k$$

-
$$k \Sigma_{ij} (V_i \cdot V_j)^2$$

- L
$$\Sigma_{ik}$$
 Vi · U(Vk)

Continuous case: n-vector models — O(n) symmetry

Classical XY model, planar rotator

$\mathbf{H} = -\mathbf{J} \ \Sigma_{ij} \ \cos(\theta_i - \theta_j) \qquad \mathbf{O(2) \ symmetry}$

KT transition at $T \sim 0.893$

Tomita & Okabe, cond-mat/0202161 Hasenbusch, cond-mat/0502556

Classical Heisenberg model

 $\mathbf{H} = -\mathbf{J} \ \Sigma_{ij} \ \mathbf{V}_i \ \cdot \ \mathbf{V}_j \qquad \mathbf{O(3) \ symmetry}$

*each vector points on the surface of unit sphere

Classical ????? model **O(4)**, **O(5)**, ... **O(∞)** symmetry

Generalization to higher dimensional sphere for site variables is straight forward, though these are purely (?) mathematical.

Mermin-Wagner Theorem (1966) These models do not show any order in finite temperature.

[O(0) : self avoiding walk (discrete), O(1) : Ising Model (discrete)]

Classical Heisenberg model $H = -J \Sigma_{ij} V_i \cdot V_j$ Ising anisotropyO(3) >>> O(1), discreteXY anisotropyO(3) >>> O(2), continuous

anisotropic perturbations can make O(n) models discrete



... it is not easy to find out recent numerical result on classical Heisenberg model (from Ising to XY anisotropy)

Once I heard that finite size scaling for the isotropic O(3) model is difficult for some (??) reason. Does any one teach me the reason???

Continuous >>>> **Discrete** (partially anisotropic)

What are the **discrete analogues** of O(n) vector models?

Classical XY model >>> q-state Clock models

$$\mathbf{H} = -\mathbf{J} \ \mathbf{\Sigma}_{ij} \ \cos(\mathbf{\theta}_i - \mathbf{\theta}_j)$$

discrete

O(2)

q = 2 : Ising Model q = 3 : 3-state Potts Model

q = 4 : 2 x (Ising Model)



 $q = 5, 6, \dots$: nearly? continuous

Classical Heisenberg model >>> Polyhedron models



Variations: each vector can point one of (a) the center of faces (b) the vertices (c) the center of edges (optional)

Icosahedron

Dodecahedron

Octahedron

Continuous >>>> **Discrete**

What are the **discrete analogues** of O(n) vector models?

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Classical Heisenberg model >>> Polyhedron models

$$\mathbf{H} = -\mathbf{J} \ \mathbf{\Sigma}_{ij} \ \mathbf{V}_i \cdot \mathbf{V}_j$$

Discretization induce Phase Transition(s)



It is obvious (?) that these discrete models can be studied by any one of the tensor network methods.

How have these models been studied by means of TN?

square lattice classical Ising Model: $H = -J \Sigma_{ij} S_i S_j$

*1-dimensional vector of length 1 on each lattice — O(1) symmetry

*Ising universality $\alpha = 0$, $\beta = 1/8$, $\gamma = 7/4$, $\delta = 15$, $\eta = 1/4$, $\nu = 1$, $\omega = 2$

DMRG — Nishino, cond-mat/9508111
CTMRG — Nishino, Okunishi, cond-mat/9507087, cond-mat/9705072
TRG — Levin, Nave, cond-mat/0611687
HOTRG — Xie, Chen, Qin, Zhu, Yang, Xiang, arXiv:1201.1144
TNR — Evenbly, Vidal, arXiv:1412.0732

* Thermodynamic **snapshot** can be obtained by means of tensor network method combined with succeeding **measurement** processes,

(arXiv:cond-mat/0409445)

similar to **METTS**, minimally entangled typical thermal state algorithm.

(arXiv:1002.1305)



Low temperature

Critical temperature

Clock Models: H = - J $\Sigma_{ij} \cos(\theta_i - \theta_j)$

discrete angles: $\theta = n (2\pi/q)$

q=2: Ising Model

q=3: equivalent to 3-state Potts model

q=4: equivalent to 2 sets of Ising models



when **q=5,6,7**... the model has **intermediate critical phase** between high-temperature disordered phase and low-temperature ordered phase. There are two **KT transitions** in low and high temperature border.

DMRG — [q=5,6] Chatelain, arXiv:1407.5955 CTMRG — [q=6] Krcmar, Gendiar, Nishino, arXiv:1612.07611 HOTRG — [q=6] Chen, Liao, Xie, Han, Huang, Cheng, Wei, Xie, Xiang, arXiv:1706.03455 HOTRG — [q=5] Chen, Xie, Yu, arXiv:1804.05532 HOTRG — [q=5,6] Hong, Kim, arXiv:1906.09036

(will be explained in detail tomorrow morning)

Clock Models on Hyperbolic Lattice

CTMRG — [q=5,6] Gendiar, Krcmar, Ueda, Nishino, arXiv:0801.0836

(n,m) lattice: m number of n-gons meet at the corner

ex. (5,4) lattice

Clock models on (5,4) lattice can be treated by CTMRG







Internal Energy

rescaled Specific Heat

Wu: Rev. Mod. Phys. 54, 235 (1982)

Potts Models: H = -J $\Sigma_i \delta(S_i, S_j)$

each spin takes integer values

Each vector points the vertex of (q-1)-dimensional **regular simplex**.

q=3: Triangle, q=4: **Tetrahedron**, q=5: 5-cell (in 4-dimension), ...

- **q=2**: equivalent to Ising model
- **q=3**: equivalent to 3-state clock model, 2nd order phase transition

q=4: 2nd order phase transition (+marginally relevant correction)

- **q=5**: weak first order
- q=6,7,8, ...

[Potts models are something between Clock and Polyhedral models.] 2D

CTMRG — [q=2,3] Nishino, Okunishi, Kikuchi, arXiv:cond-mat/9601078 CTMRG — [q=5] Nishino, Okunishi, arXiv:cond-mat/9711214 DMRG — [q=4,5,...] Igloi, Carlon, arXiv:cond-mat/9805083 HOTRG — [q=2~7] Morita, Kawashima, arXiv:1806.10275

3D

TPVA — [q=2,3] Nishino, Okunishi, Hieida, Maeshima, Akutsu, arXiv:cond-mat/0001083 TPVA — [q=3,4,5] Gendiar, Nishino, arXiv:cond-mat/0102425 HOTRG — [q=2,3] Wang, Xie, Chen, Normand, Xiang, arXiv:1405.1179

Potts Models: H = -J $\Sigma_i \delta(S_i, S_j)$

people prefer to cite good review(s).

Wu: Rev. Mod. Phys. 54, 235 (1982)

That is good. Also I recommend to add original article(s)

Potts, Renfrey B. (1952). "Some Generalized Order-Disorder Transformations". *Mathematical Proceedings*. 48 (1): 106–109. Bibcode:1952PCPS...48..106P. doi:10.1017/S0305004100027419.

How about Ising Model ???

Ising, E. (1925), "Beitrag zur Theorie des Ferromagnetismus", *Z. Phys.*, **31** (1): 253–258, Bibcode:1925ZPhy...31..253I, doi:10.1007/BF02980577

Wu: Rev. Mod. Phys. 54, 235 (1982)

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MC — Surungan, Okabe, arXiv:1709.03720



Variants:

If one considers semi-regular polyhedrons, or truncated polyhedrons, one can further define discrete Heisenberg models. Also those cases where each site vector can point centers of faces or edges can be considered. By such generalizations, q=18,24,36,48,60,72,90,120,150,180 can be considered.

* We conjecture that some of these variants show multiple phase transitions.



Tetrahedron

is there any high precision numerical study by TN?

... a vanguard for TN study



Cube: Ising x 3 (Exactly Solved)



Octahedron

MC 2nd Order [Surungan&Okabe, 2012]

> **1st Order** [Roman,*et al*., 2016]

> > **CTMRG**



Icosahedron

2nd Order [Patrascioiu, et al., 2001] MC arXiv:hep-lat/0008024

[Surungan&kabe, 2012] MC

arXiv:1709.03720



Dodecahedron

KT? [Patrascioiu, et al., 1991] MC 2nd Order MC [Surungan&Okabe, 2012]

arXiv:1709.03720



Octahedron Model (q=6)

CTMRG — Krcmar, Gendiar, Nishino, arXiv:1512.09059



Dodecahedron

ahedron

Free energy per site f(T) is calculated by CTMRG under fixed or free boundary conditions at the border of the system.

This model is characteristic in the point that interaction energy is either 1, 0, or -1.

No singularity exists in f(T), two lines cross at T = 0.908413.

Latent Heat: Q = 0.073



Discussion: What kind of perturbation makes the model critical?

a Generalization to

CTMRG — Krcmar, Gendiar, Nishino, arXiv:1512.09059

Truncated Tetrahedron Model (q=12)



FIG. 1. Truncated tetrahedron (shown in the middle, parametrized by t = 0.5) is depicted as the interpolation between the octahedron (on the left for t = 0) and the tetrahedron (on the right for t = 1).

- * This model shows multiple phase transitions.
- * This kind of generalization can be considered for other polyhedron modles.

each site vector points to one of the vertices.





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arXiv:1709.03720

Icosahedron Model:

✓ Symmetry axis
 Centers of edges (two-fold)
 Centers of faces (three-fold)
 Two opposite vertices (five-fold)



What kind of symmetry breaking happens at Tc ? Is there multiple phase transitions? Any possibility of KT transition?

Numerical Analysis by CTMRG under m = 500

calculations were done on K-computer by Ueda. dimension of CTM: 6000

arXiv:1709.01275

... there would be some trick to reduce the site degrees of freedom in advance ...



prob. of directions under fixed B.C.



5-fold rotational symmetry is preserved in low temperature

arXiv:1709.01275



strong m-dependence exists

arXiv:1709.01275

Finite-*m* **scaling**

✓ Finite size scaling [Fisher and Barber, 1972, 1983]

+ Finite-*m* scaling at criticality

Nishino, Okunishi and Kikuchi, PLA (1996) Tagliacozzo, Oliveira, Iblisdir, and Latorre, PRB (2008) Pollmann, Mukerjee, Turner, and Moore, PRL (2009) Pirvu, Vidal, Verstraete, and Tagliacozzo, PRB (2012)

$$\langle A \rangle(b,t) = b^{x_A/\nu} f_A\left(b^{1/\nu}t\right)$$

b: Intrinsic length scale of the system

$$t = T/T_c - 1$$

$$f_A(y) \sim y^{-x_A} \text{ for } y \gg 1$$

$$f_A(y) \sim \text{ const for } y \to 0$$

✓ Correlation length

 $\xi(m,t) = [\ln(\zeta_1/\zeta_2)]^{-1}$

 ζ_1 and ζ_2 : 1st and 2nd eigenvalues of $^{\text{TM}}$

✓ Scaling hypothesis $\xi(m,t) \sim m^{\kappa}g(m^{\kappa/\nu}t)$

 $m^{\kappa} \gg t^{-\nu} : \xi(m,t) \sim t^{-\nu}$ for a finite t $m^{\kappa} \ll t^{-\nu} : \xi(m,t) \sim m^{\kappa}$ for a finite m

 $\checkmark b \sim \xi(m, t)$ $\langle A \rangle(m, t) = m^{x_A \kappa/\nu} \chi_A\left(m^{\kappa/\nu} t\right)$

For a finite t with $m^{\kappa/\nu} t \gg 1$: $A(m,t) \sim |t|^{-x_A}$ For a finite m with $m^{\kappa/\nu} t \ll 1$: $A(m,t) \sim m^{-x_A/\nu}$

We use the scaling library developed by Harada.

arXiv:1102.4149



Finite-*m* scaling $\checkmark \beta = 0.129$



arXiv:1709.01275

Entanglement Entropy

$$S_{\rm E} = -\mathrm{Tr}(\mathbf{C}^4/Z)\ln(\mathbf{C}^4/Z)$$

Vidal, Latorre, Rico, and Kitaev, PRL, 2003 Calabrese and Cardy, J. Stat. Mech., 2004

$$S_{\rm E}(m,t) \sim \frac{c}{6} \log \xi(m,t) + const.$$

a: non-universal constant *c*: central charge

$$e^{S_{\rm E}} \sim a[\xi(m,t)]^{c/6} = a[m^{\kappa}g(m^{\kappa/\nu}t)]^{c/6} = m^{c\kappa/6}g''(m^{\kappa/\nu}t), g'' = ag^{c/6}$$

Entanglement Entropy



[Pollmann, Mukerjee, Turner, and Moore, PRL, 2009]

This work:

 $\frac{6}{c\left(\sqrt{12/c}+1\right)} - \kappa = 0.003$

Icosahedron model



- ✓ there is a phase transition of 2nd order
- Ordered phase has five-fold rotational symmetry

Phys. Rev. E **96**, 062112 (2017) arXiv:1709.01275

Тс	¥nu	¥kappa	¥beta	С
0.5550(1)	1.62(2)	0.89(2)	0.12(1)	1.90(2)

Current study



Tetrahedron

is there any high precision numerical study by TN?

... a vanguard for TN study



Cube: Ising x 3 (Exactly Solved)

Next Target 20 site degrees of freedom



Octahedron

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CTMRG



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[Surungan&kabe, 2012] MC arXiv:1709.03720

Dodecahedron KT? [Patrascioiu, et al., 1991] MC 2nd Order MC [Surungan&Okabe, 2012] arXiv:1709.03720

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... preliminary (but extensive) calculation suggests that there is only a phase transition



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Dodecahedron KT? [Patrascioiu, et al., 1991] MC 2nd Order MC [Surungan&Okabe, 2012] arXiv:1709.03720

Future studies

Current Target

24 state



30 state





These models might show multiple phase transitions, since there are inequivalent directions.



Higher Dimension (inner space)

Tetrahedron >>> n-symplex (in n+1 dim.) n-state Potts Model

Characteristic 4-polytopes



24-cell

(possible to fill 4D space only by this polytope.)



Octahedron >>> 16-cell, 32, 64, ... n-set of Ising Model



Cube >>> Hyper Cube

Akiyama et al, arXiv:1911.12978 Weak First Order? in 4D??





numerical challenges

600-cell

Further Generalizations:

It is possible to treat the case that each **site vector** can point arbitrary lattice point in N-dimensional space. (= 2D lattice **embedded** to N-dim. space.)

What is the effect of perturbation/deformation with polyhedral symmetry to the continuous O(3) model?

How can one apply tensor network method to **spherical model**? (it is not straight forward to apply TN for exactly solved models.)

What is the role of TN in higher dimensional lattice? (>>> day 3 in TNSAA7)