

Tensor Networks for Statistical Mechanics

Tomotoshi. Nishino (Kobe University)

Part II. 17:00 PM (Kobe), 24 Feb. 2021

Fractal lattice (just glance at)

Crystal Surface (**Disordered Flat** phase, Steps, etc.)

Polygon and Polytope Models

Hyperbolic lattices (optional)

Random-bond Ising model (optional)

Ads from Okunishi: Coming Workshop in March

<http://www2.yukawa.kyoto-u.ac.jp/~qith2021/index.php>

Fractals

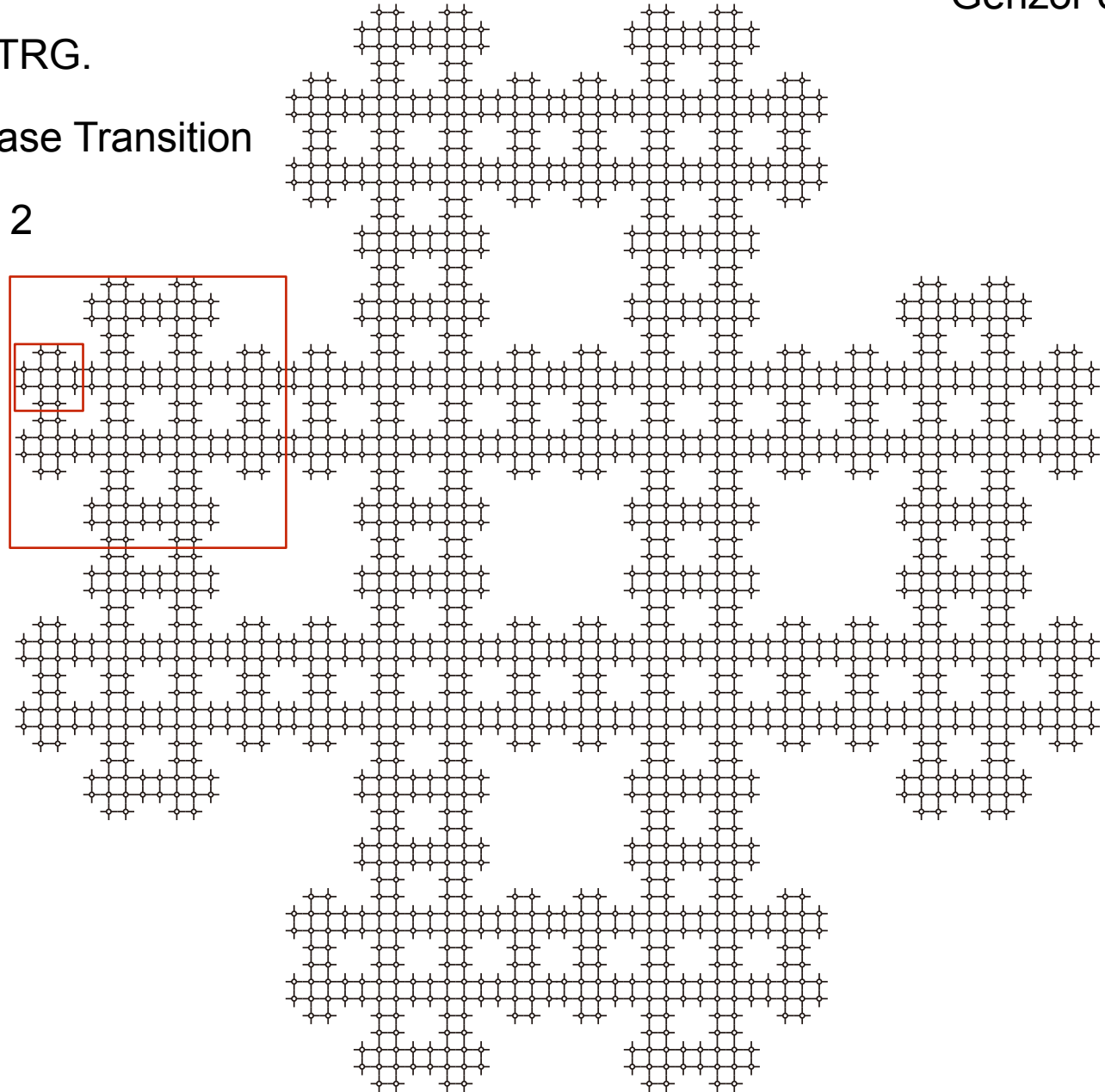
arxiv:1509.05596

Genzor et al

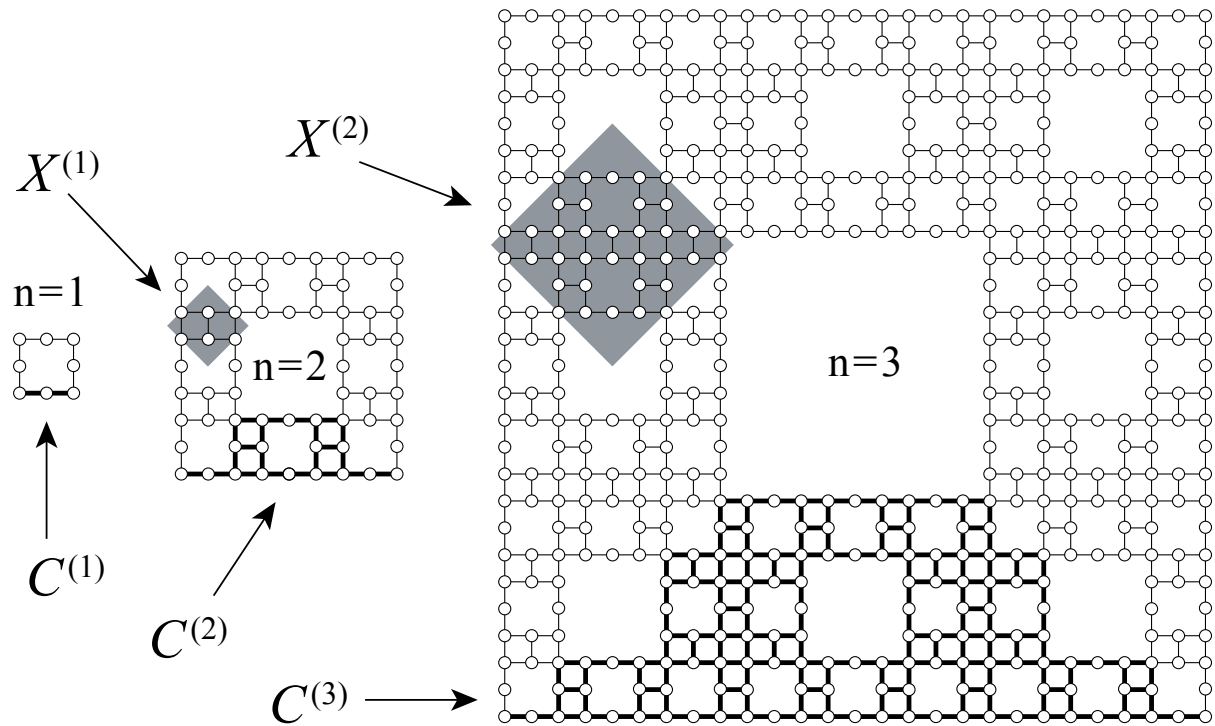
This fractal lattice fits TRG.

Ising Model shows phase Transition

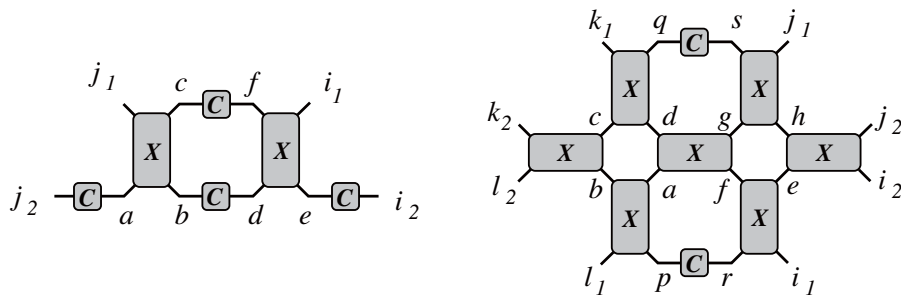
effective space dim. < 2



another Fractal: Sierpinski Carpet



Effective dimension of the system is less than 2.



HOTRG can be applied

(MPS studies of) **Crystal Surface**

AKLT, Phys. Rev. Lett. **59**, 799 (1987)

Preroughening transitions in Surfaces,

K. Rommelse and M. den Nijs, Phys. Rev. Lett. **59**, 2578 (1987)

**Preroughening transitions in crystal surfaces
and valence-bond phases in quantum spin chains,**

M. den Nijs and K. Rommelse, Phys. Rev. B **40**, 4709 (1989)

related web page

<http://faculty.washington.edu/london/research/prerough.html>

Equilibrium Crystal Shape

[Arxiv:](#) (Series of studies by Noriko Akutsu)

[1903.09929](#) [1711.05015](#) [1510.00899](#)

[1204.5574](#) [1104.3393](#) [cond-mat/0107021](#)

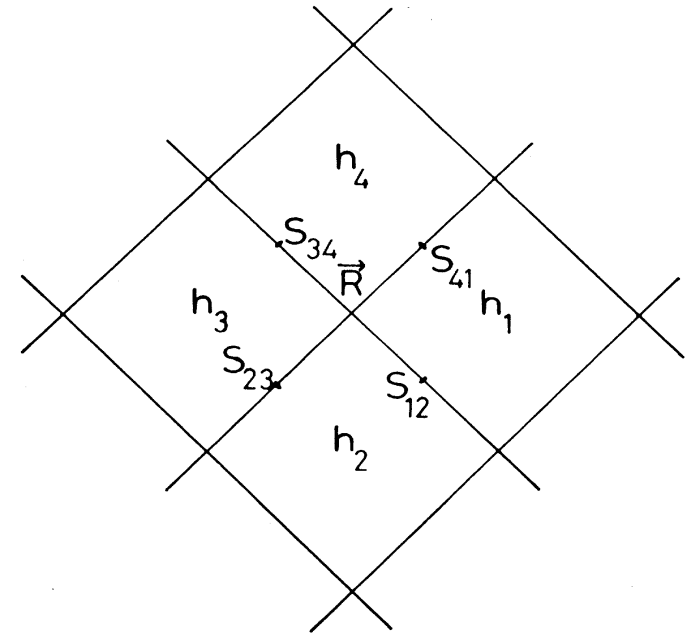
[cond-mat/0104559](#) [cond-mat/0012162](#)

[cond-mat/0011210](#) [cond-mat/9903448](#)

RSOS Model

On the solid surface, atoms are stacking on top of each other. (Solid on Solid)

Surface state is specified by the height h , where the nearest neighbor sites can differ at most one. (Restriction) ex. h_1 and h_2 , etc.



(Step Energy)

When the height differs by one between nearest neighbor sites, energy increases by E . (A large E favors the completely flatness.)

(Step Repulsion)

When the height differs by two between next nearest neighbor sites (in the diagonal direction), energy increases by Q . ex. h_1 and h_3 , h_2 and h_4 , etc.

(IRF Model)

... thus local energy is determined 4 heights surrounding a surface, denoted as a crossing point of lines in the figure.

Preroughening Transitions in Surfaces

Disordered Flat (DOF) Phase

Koos Rommelse and Marcel den Nijs

Department of Physics, University of Washington, Seattle, Washington 98195

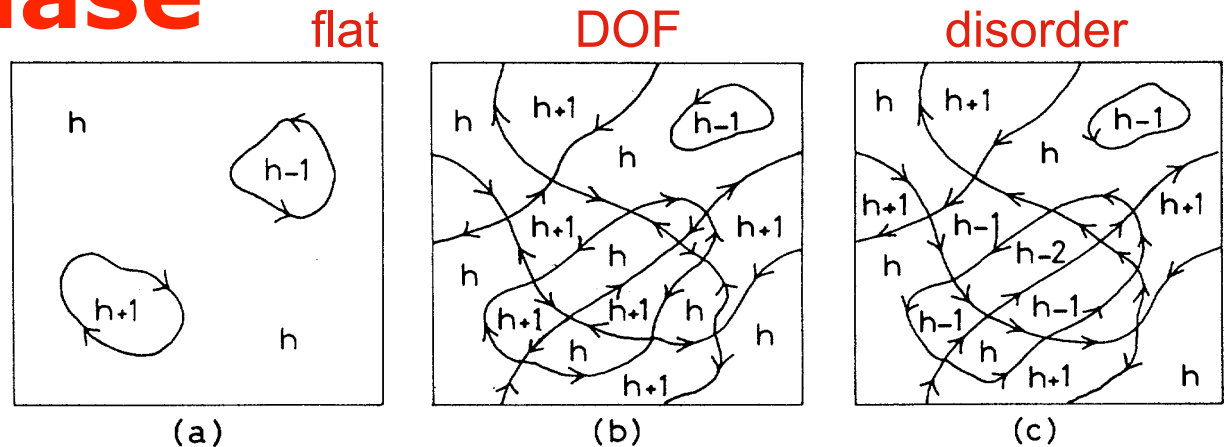
(Received 28 September 1987)

We introduce a new type of phase of crystal surface and interfaces. This disordered flat phase appears intermediate between the familiar flat and rough phases in the presence of short-range interactions of a type common in experiments. The surface remains flat on average although it contains a disordered array of steps. The preroughening transition into the disordered flat phase belongs to a new universality class. Finite-size-scaling calculations for the restricted solid-on-solid model confirm the existence of the disordered flat phase and the preroughening transition.

Quantum-Classical correspondence: d -dimensional quantum system and $(d+1)$ -dimensional classical system share the same property. How about the Haldane State? Here is their reply!!!

The RSOS model is related to the one-dimensional spin-1 quantum chain. We can show⁵ that the DOF-type order is related to the so-called Haldane gap,⁸ and that the preroughening transition is analogous to one of the transitions⁹ in that model.

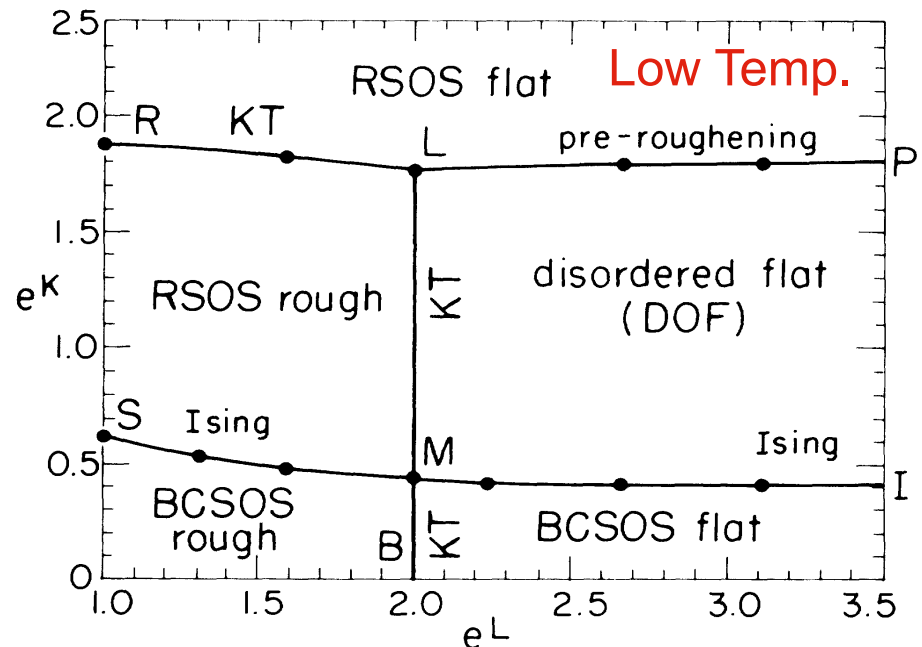
Disordered Flat Phase



$$H_{\text{RSOS}} = -K \sum_{\langle \mathbf{r}, \mathbf{r}' \rangle} \delta(|h(\mathbf{r}) - h(\mathbf{r}')| - 1) - L \sum_{(\mathbf{r}, \mathbf{r}'')} \delta(|h(\mathbf{r}) - h(\mathbf{r}'')| - 2).$$

$\langle \mathbf{r}, \mathbf{r}' \rangle$ denotes nn bonds on a square lattice: $(\mathbf{r}, \mathbf{r}'')$ denotes next-nearest-neighbor and vanishes otherwise. Energies are measured in units of $-1/k_B T$. $L > 0$ favors neighbors.

When the step repulsion L (kT) is large, a flat phase with disorder is realized. This is the DOF state.



Disordered Flat Phase and Haldane Phase

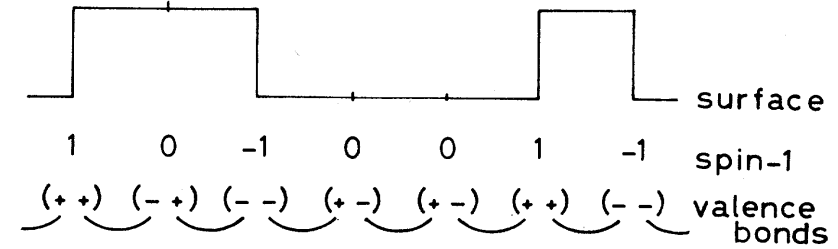
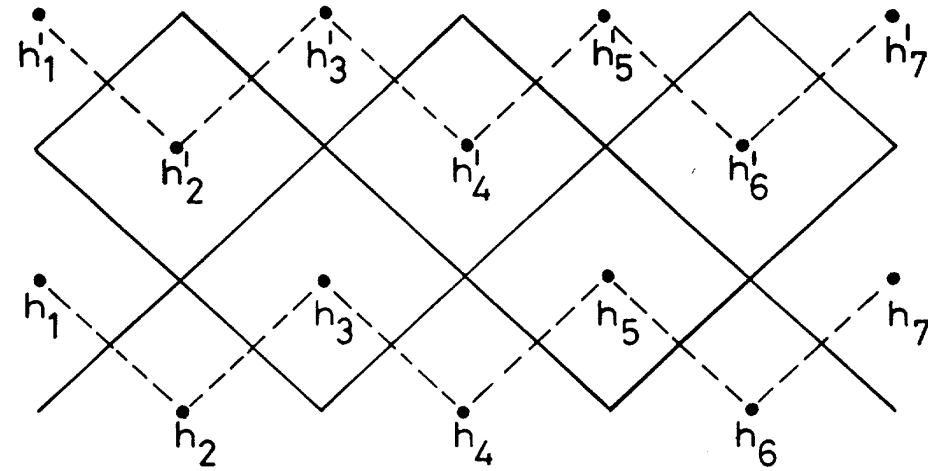


FIG. 15. Typical (side view) configuration in the DOF phase for the RSOS model, as seen from, respectively, the crystal surface, spin-1, and VBS perspective.

Transfer matrix to the diagonal direction has a good correspondence with the quantum spin chain.

Step height of the DOF phase can be regarded as S_z of each spin located between faces.

See details (Rommelse and den Nijis, 1989)

PHYSICAL REVIEW B

VOLUME 40, NUMBER 7

1 SEPTEMBER 1989

Preroughening transitions in crystal surfaces and valence-bond phases in quantum spin chains

Marcel den Nijis

Department of Physics, FM-15, University of Washington, Seattle, Washington 98195

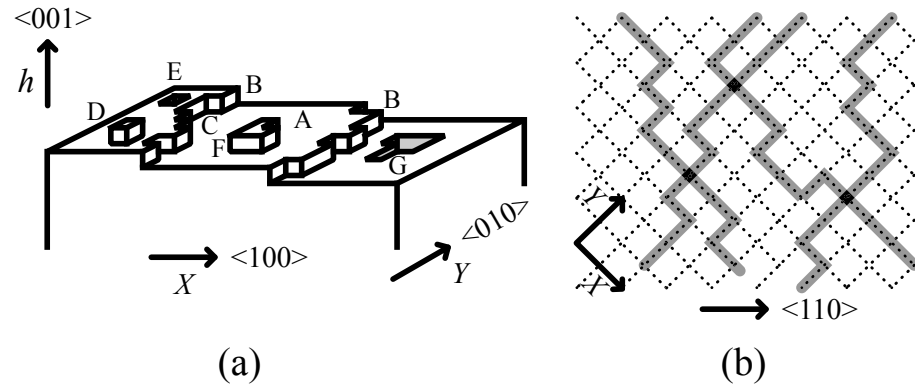
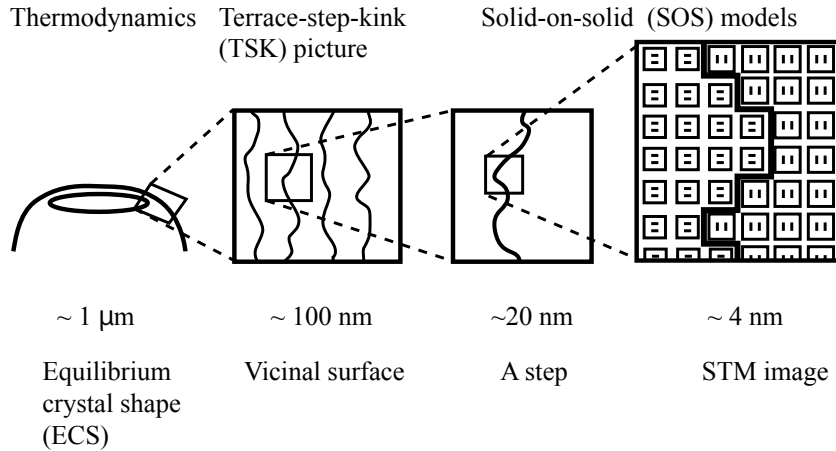
Koos Rommelse

Department of Theoretical Physics, University of Oxford, 1 Keble Road, Oxford OX1 3NP, United Kingdom

(Received 10 April 1989)

Noriko Akutsu, J. Phys. Condens. Matter 23, 485004 (2011) (arXiv:1104.3393)

“Non-universal equilibrium crystal shape results from sticky steps”



Figures from arXiv:1104.3393 and 1903.09929 by N.Akutsu

Numerical analyses by MPS

(Series of studies by Noriko Akutsu)

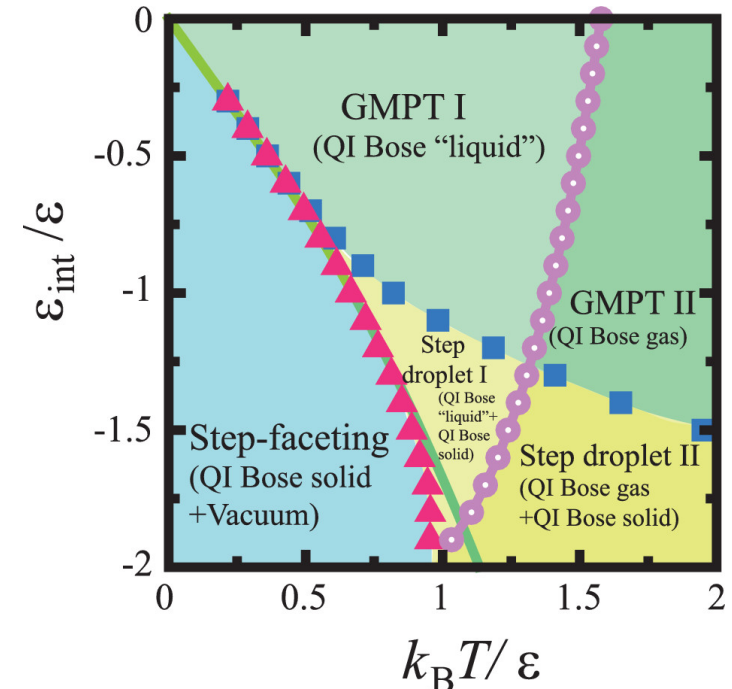
[Arxiv:](#)

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[1204.5574](#) [1104.3393](#) [cond-mat/0107021](#)

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Polyhedral Models

*** not much is known for classical Heisenberg model on 2D Lattice ***

... numerical calculation tend to “observe” phase transition (!!!)

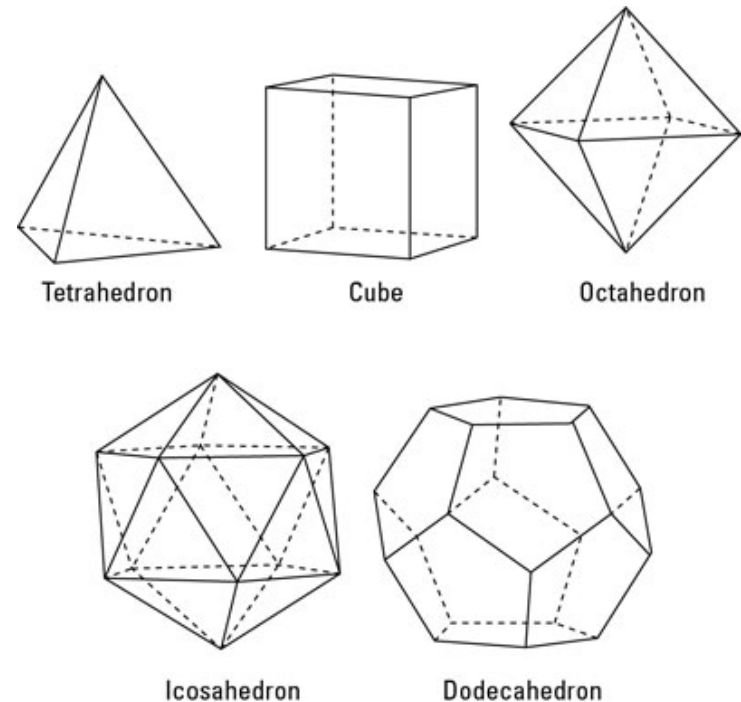
>>> how about the **discrete Analogues?**

— application of **CTMRG** to
Statistical Mechanical Models —

Phys. Rev. E 94, 022134 (2016); arXiv:1512.09059

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

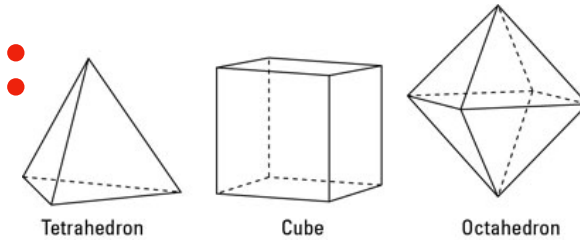
arXiv:1612.07611



Tomotoshi Nishino (Kobe Univ.), Hiroshi Ueda (RIKEN), Seiji Yunoki (RIKEN)
Koichi Okunishi (Niigata Univ.), Roman Krmar (SAS), Andrej Gendiar (SAS)

Regular Polyhedron Models:

Each site vector can point one of the vertices the regular polyhedron.



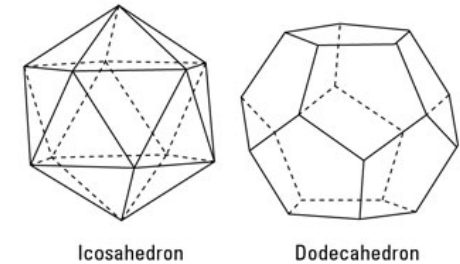
q=4: Tetrahedron Model, corresponds to q=4 Potts Model

q=6: Octahedron Model (weak first order)

q=8: Cube Model, equivalent to 3-set of Ising Model

q=12: Icosahedron Model (2nd order)

q=20: Dodecahedron Model (2nd order)



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

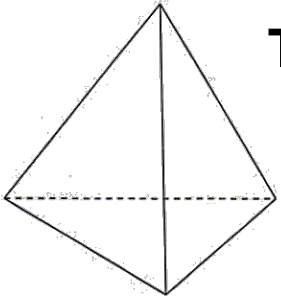
- * Do these models show KT transition? (...no, when there is no anisotropy)
- * Is there any model that shows multiple phase transitions? (... no, in reality)

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.

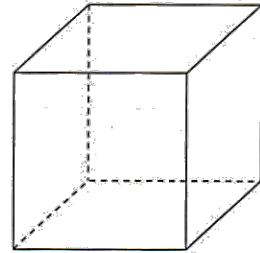
- * We conjecture that some of these variants show multiple phase transitions.

previous studies



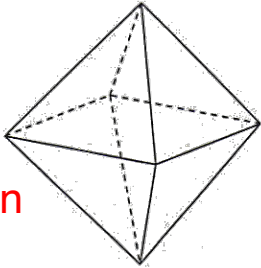
Tetrahedron

is there any high precision numerical study by TN?
... a vanguard for TN study



Cube: Ising x 3
(Exactly Solved)

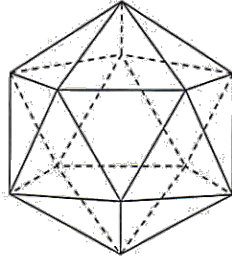
Probably 1st order in any dimension



Octahedron

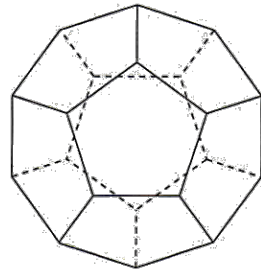
MC 2nd Order
[Surungan&Okabe, 2012]

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



Icosahedron

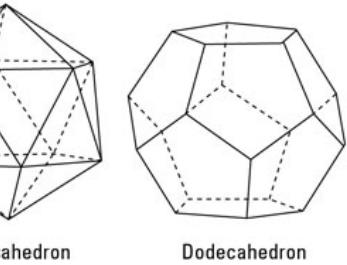
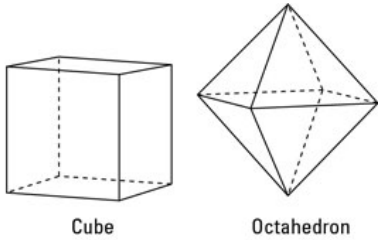
2nd Order
[Patrascioiu, et al., 2001] **MC**
arXiv:[hep-lat/0008024](https://arxiv.org/abs/hep-lat/0008024)
[Surungan&kabe, 2012] **MC**
arXiv:[1709.03720](https://arxiv.org/abs/1709.03720)



Dodecahedron

KT?
[Patrascioiu, et al., 1991] **MC**
↓
2nd Order **MC**
[Surungan&Okabe, 2012]
arXiv:[1709.03720](https://arxiv.org/abs/1709.03720)

Octahedron Model ($q=6$)



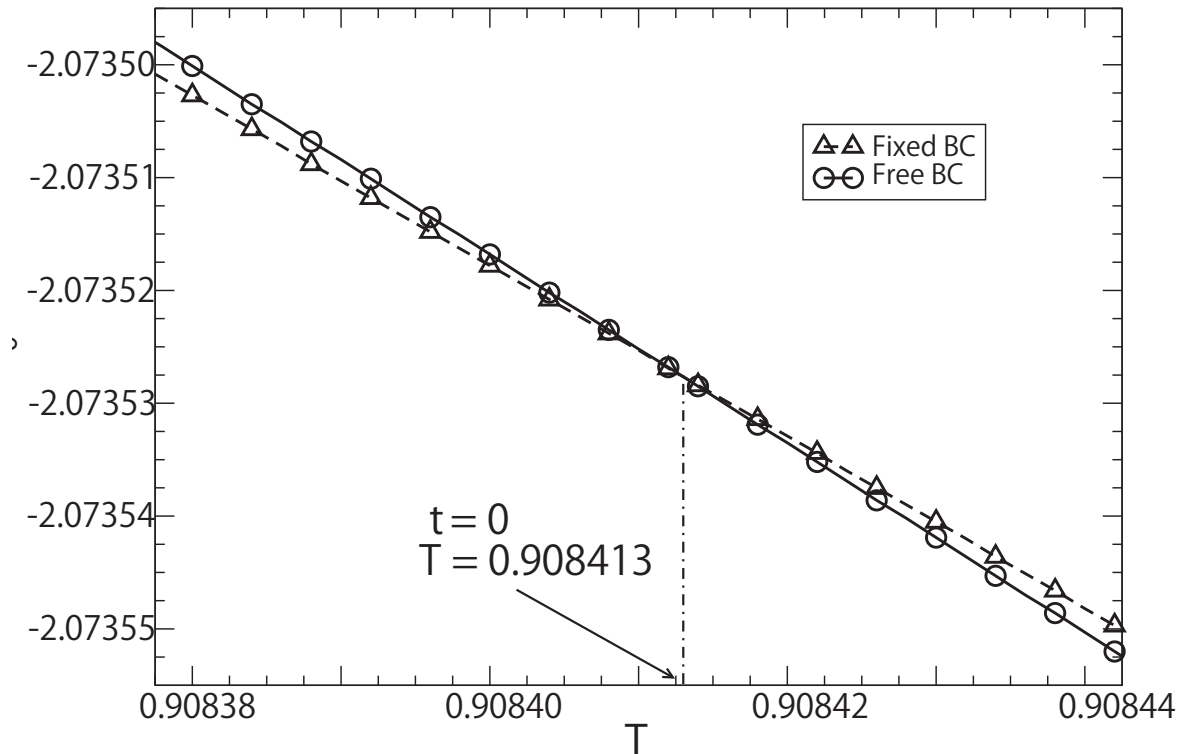
CTMRG — Krčmar, Gendiar, Nishino, [arXiv:1512.09059](https://arxiv.org/abs/1512.09059)

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.

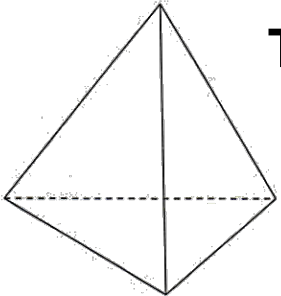
No singularity exists in $f(T)$, two lines cross at $T = 0.908413$.

Latent Heat: $Q = 0.073$



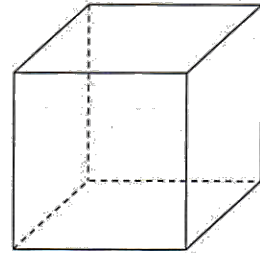
Discussion: What kind of perturbation makes the model critical?

previous studies

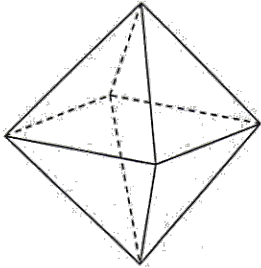


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Cube: Ising x 3
(Exactly Solved)



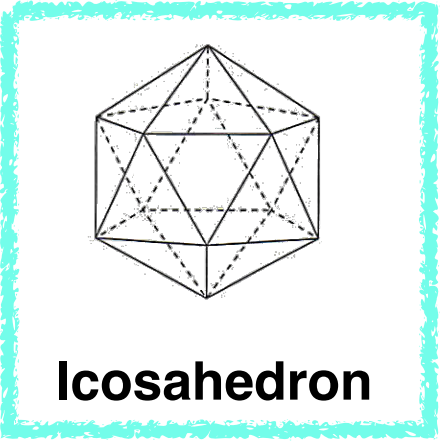
Octahedron

MC 2nd Order
[Surungan&Okabe, 2012]



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

CTMRG



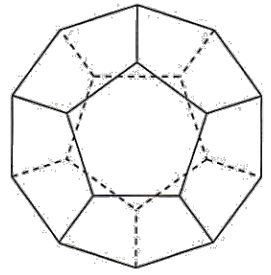
Icosahedron

2nd Order
[Patrascioiu, et al., 2001] **MC**

arXiv:[hep-lat/0008024](https://arxiv.org/abs/hep-lat/0008024)

[Surungan&kabe, 2012] **MC**

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Dodecahedron

KT?

[Patrascioiu, et al., 1991]

MC



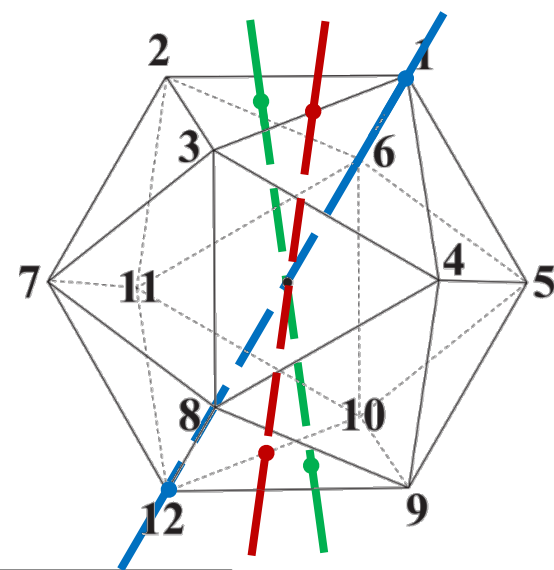
2nd Order **MC**

[Surungan&Okabe, 2012]

arXiv:[1709.03720](https://arxiv.org/abs/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 T_c ?
Is there multiple phase transitions?
Any possibility of KT transition?

Numerical Analysis by CTMRG under $m = 500$

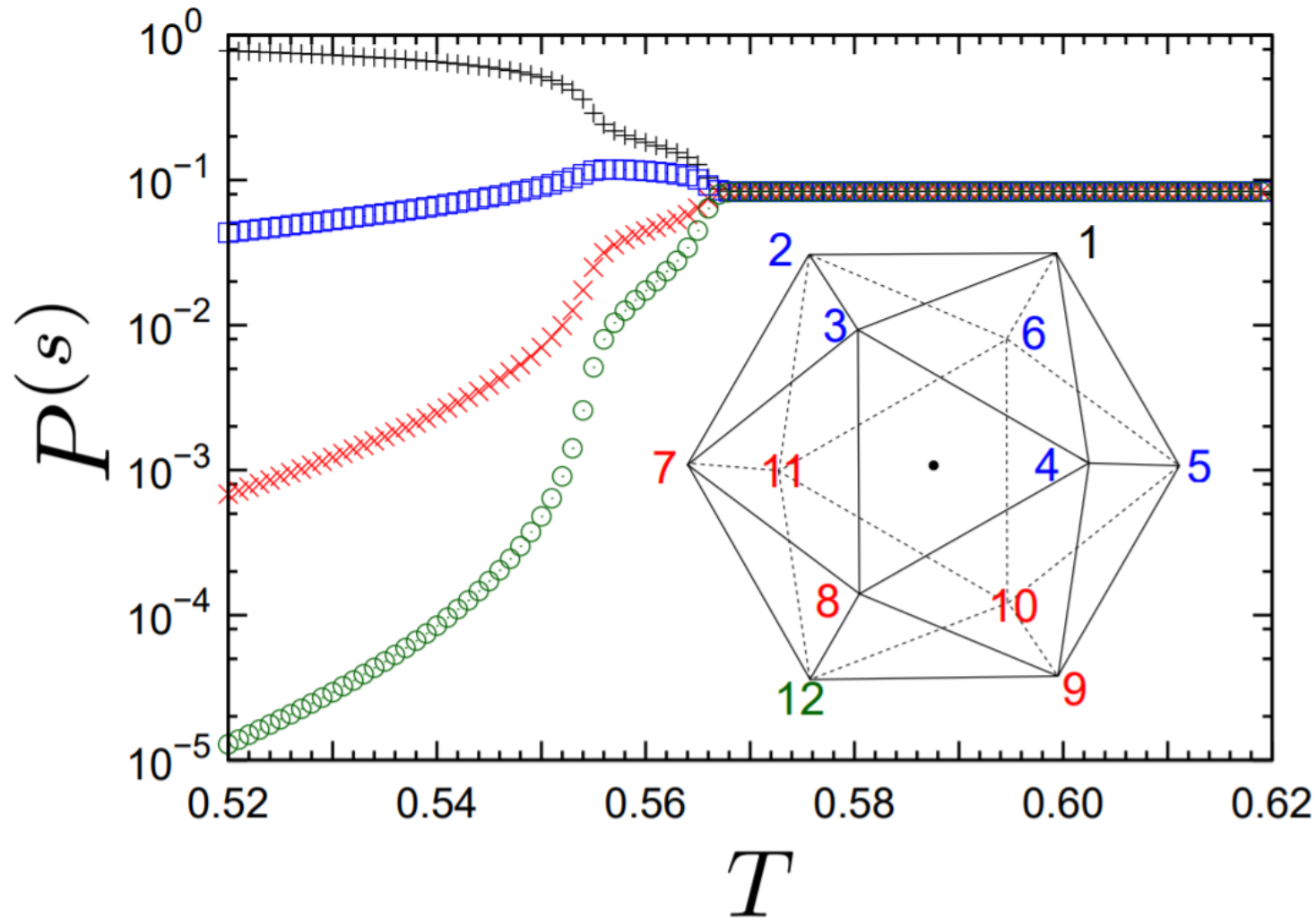
calculations were done on K-computer by Ueda.
dimension of CTM: 6000

arXiv:[1709.01275](https://arxiv.org/abs/1709.01275)

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



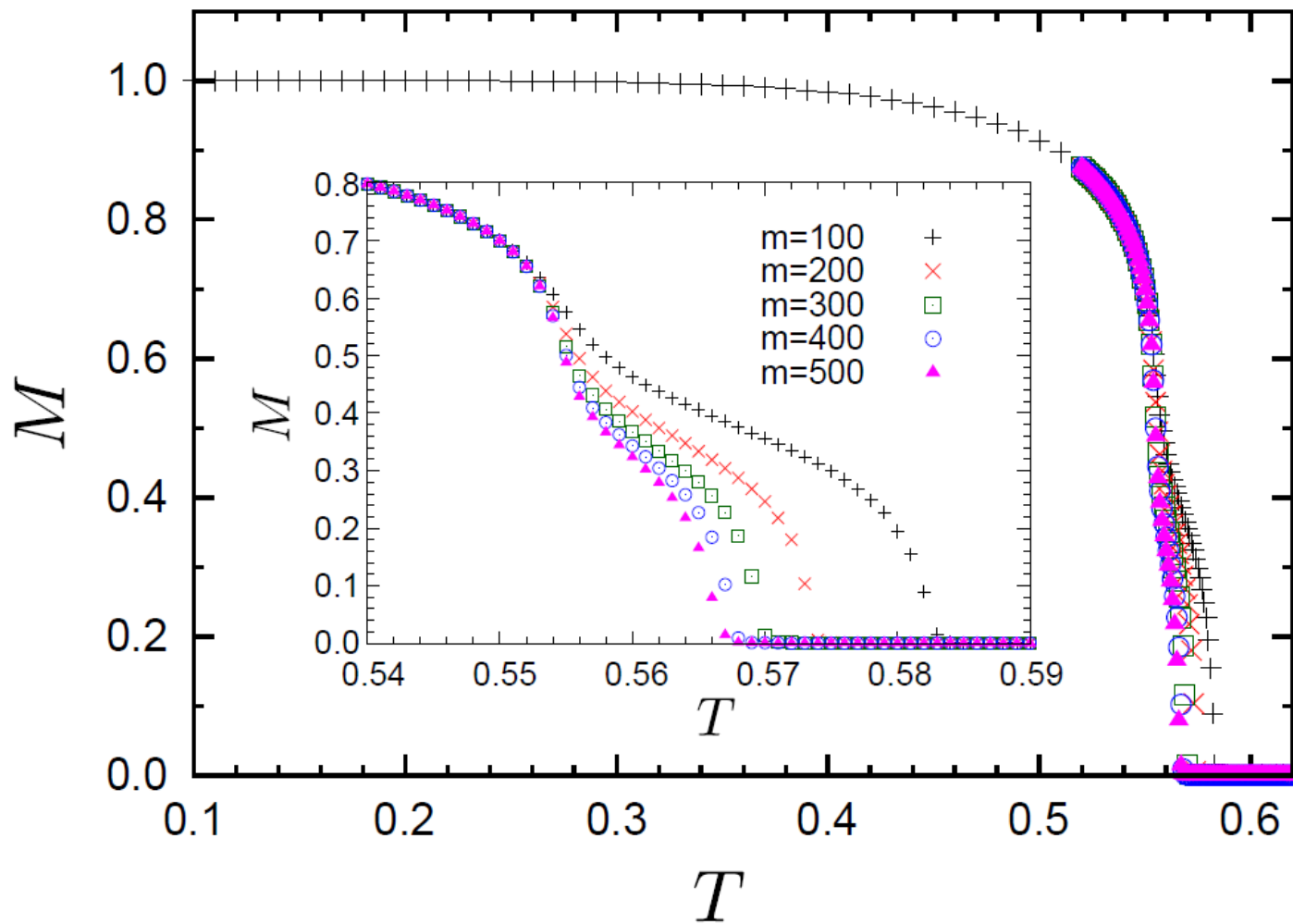
prob. of directions under fixed B.C.



5-fold rotational symmetry is preserved in low temperature

Spontaneous Magnetization

$$M = \frac{1}{Z} \sum_{s=1}^{12} \left(\mathbf{v}^{(1)} \cdot \mathbf{v}^{(s)} \text{Tr}' [C^4] \right)$$



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

$$t = T/T_c - 1$$

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

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

✓ Correlation length

$$\xi(m, t) = [\ln(\zeta_1/\zeta_2)]^{-1} \quad \zeta_1 \text{ and } \zeta_2: \text{1st and 2nd eigenvalues of } \mathcal{T}^m$$

✓ Scaling hypothesis

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

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

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

✓ $b \sim \xi(m, t)$

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

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

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

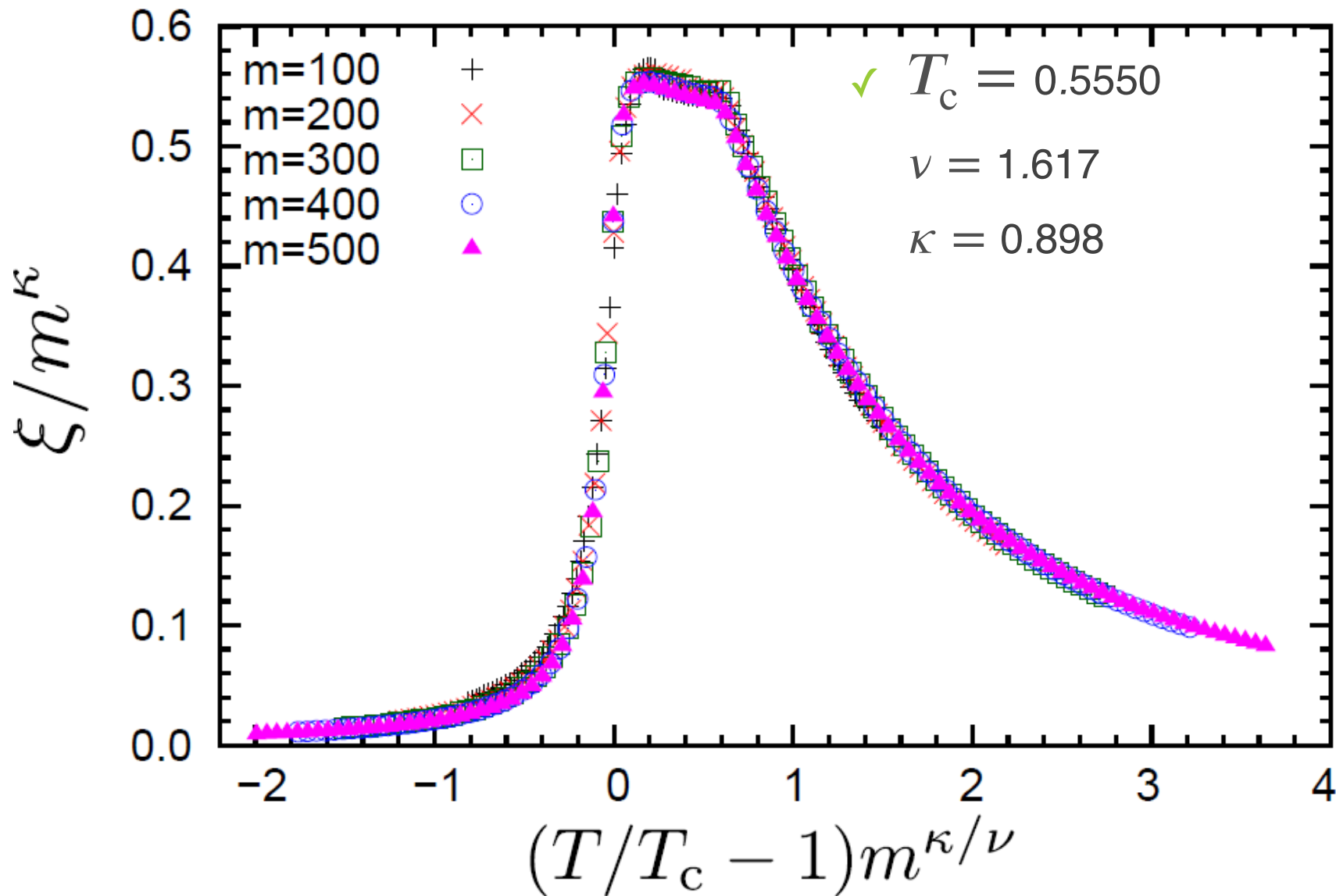
We use the scaling library developed by Harada.

Finite- m scaling for ξ

arXiv:1102.4149

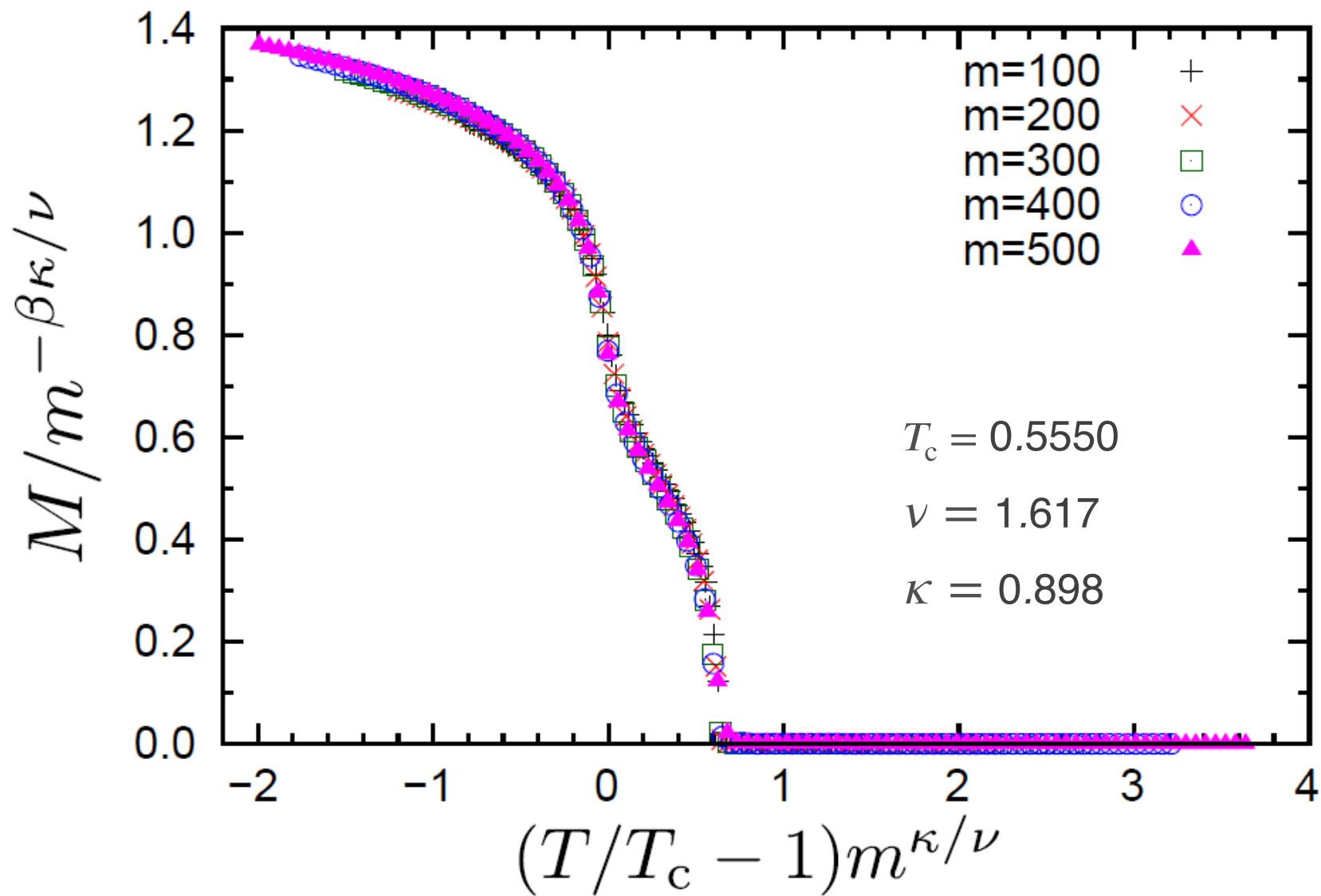
✓ Bayesian scaling

[Harada, PRE, 2011]



Finite- m scaling

✓ $\beta = 0.129$



Entanglement Entropy

$$S_E = -\text{Tr}(\mathbf{C}^4 / Z) \ln(\mathbf{C}^4 / Z)$$

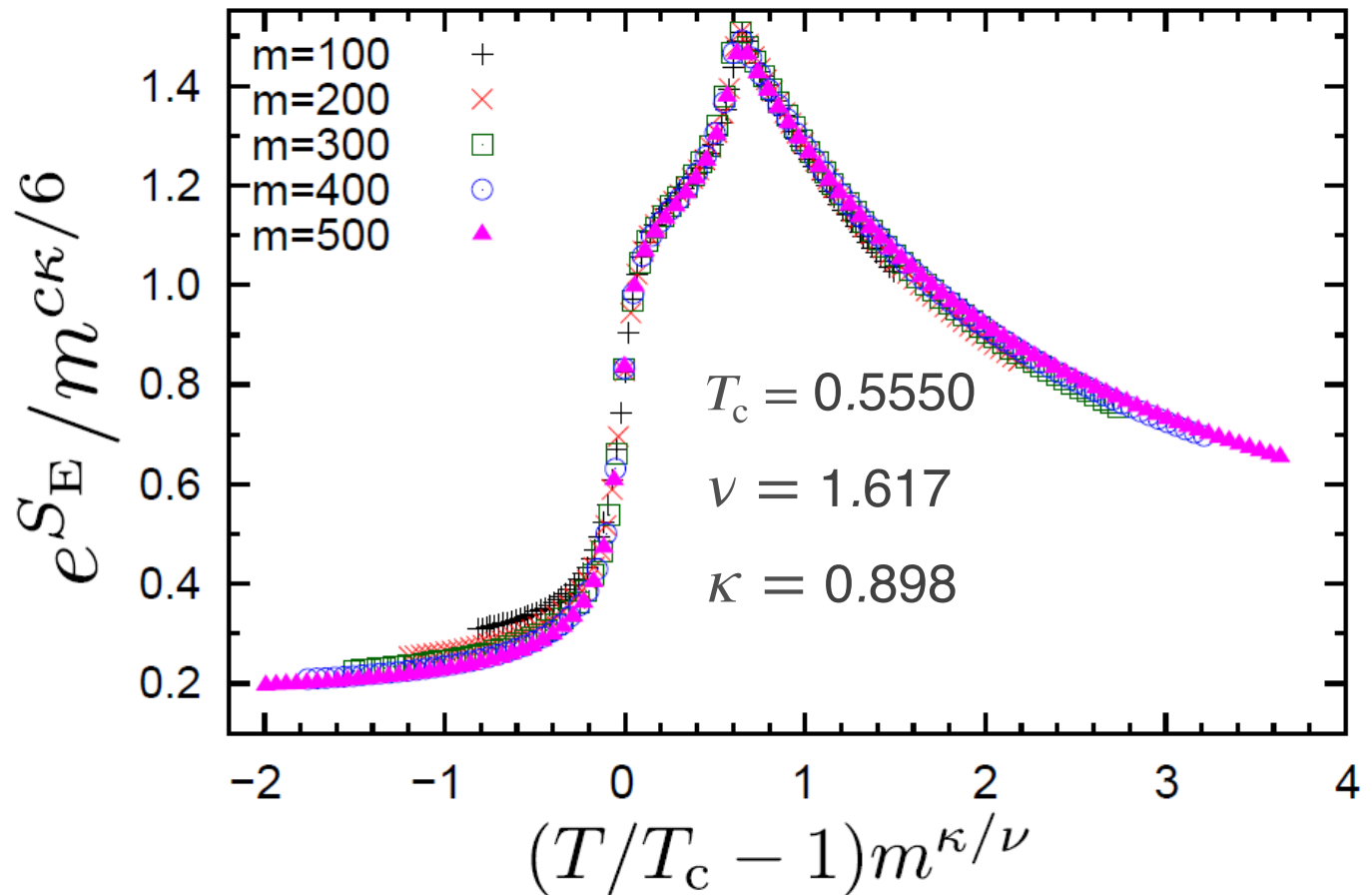
Vidal, Latorre, Rico, and Kitaev, PRL, 2003
Calabrese and Cardy, J. Stat. Mech., 2004

$$S_E(m, t) \sim \frac{c}{6} \log \xi(m, t) + \text{const.}$$

a : non-universal constant
 c : central charge

$$\begin{aligned} e^{S_E} &\sim a[\xi(m, t)]^{c/6} \\ &= a[m^\kappa g(m^{\kappa/\nu} t)]^{c/6} \\ &= m^{c\kappa/6} g''(m^{\kappa/\nu} t), \quad g'' = a g^{c/6} \end{aligned}$$

Entanglement Entropy



✓ One parameter

$$c = 1.894$$

✓ Empirical relation

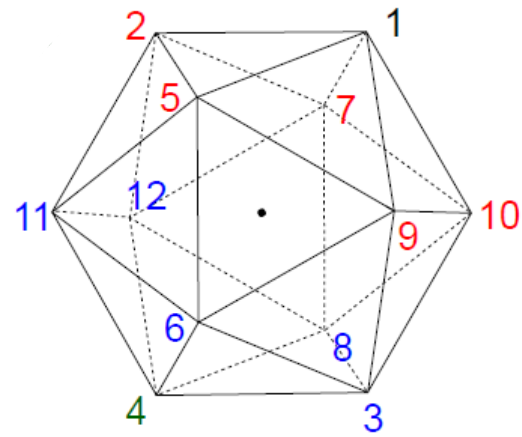
$$\kappa = \frac{6}{c(\sqrt{12/c} + 1)}$$

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

This work:

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

Icosahedron model

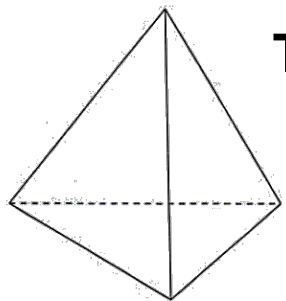


- ✓ there is a phase transition of 2nd order
- ✓ Ordered phase has five-fold rotational symmetry

Phys. Rev. E **96**, 062112 (2017)

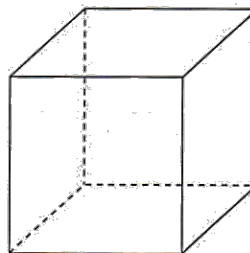
arXiv:[1709.01275](https://arxiv.org/abs/1709.01275)

T_c	ν	κ	β	c
0.5550(1)	1.62(2)	0.89(2)	0.12(1)	1.90(2)



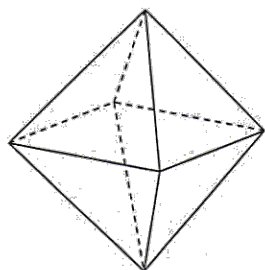
Tetrahedron

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



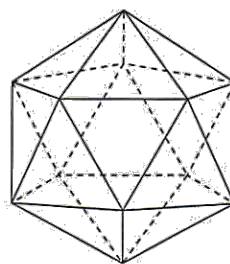
Octahedron

MC 2nd Order
[Surungan&Okabe, 2012]



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

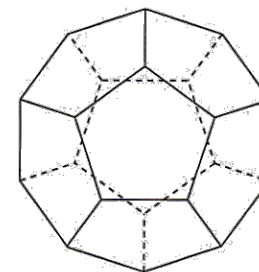
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Dodecahedron

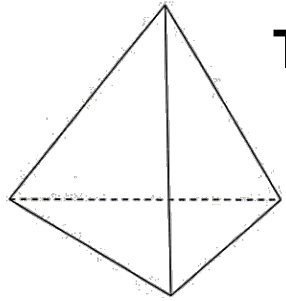
KT?

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MC



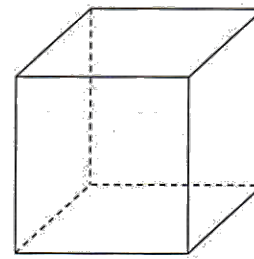
2nd Order **MC**
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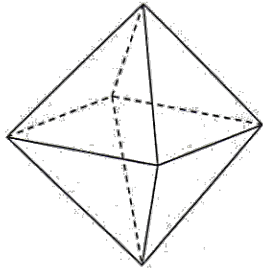
Tetrahedron

is there any high precision numerical study by TN?

... a vanguard for TN study



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



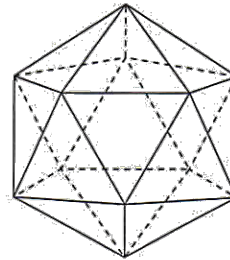
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1st Order
[Roman, et al., 2016]

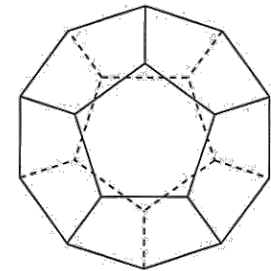
CTMRG



Icosahedron

2nd Order
[Patrascioiu, et al., 2001] **MC**
arXiv:[hep-lat/0008024](https://arxiv.org/abs/hep-lat/0008024)

[Surungan&kabe, 2012] **MC**
arXiv:[1709.03720](https://arxiv.org/abs/1709.03720)



Dodecahedron

KT?

[Patrascioiu, et al., 1991]

MC

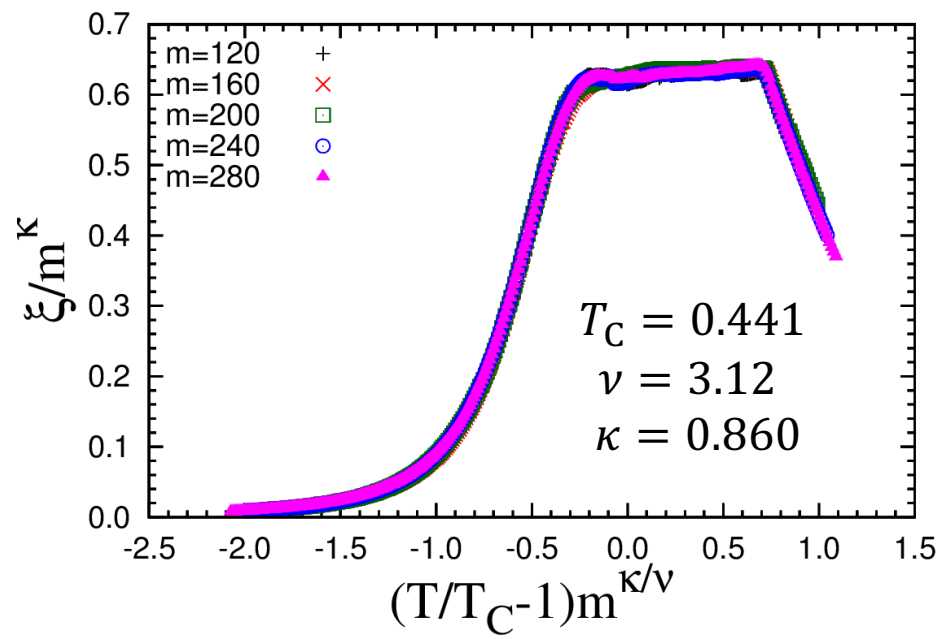
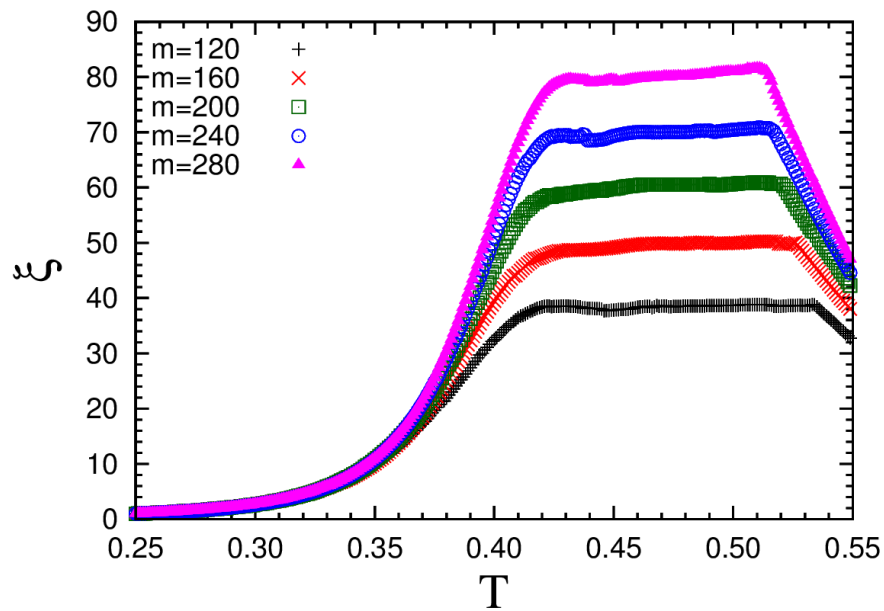
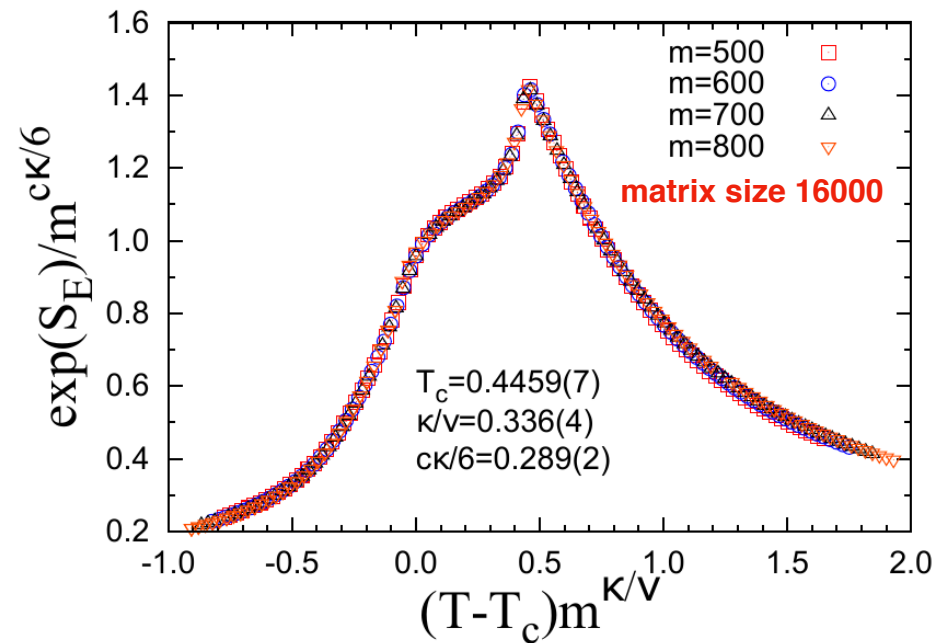


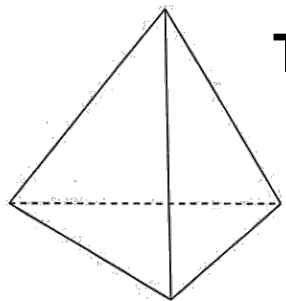
2nd Order **MC**
[Surungan&Okabe, 2012]

arXiv:[1709.03720](https://arxiv.org/abs/1709.03720)

arXiv:2004.08669

Finite m scaling
(probably) supports
the absence of
massless area

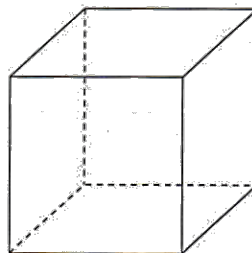




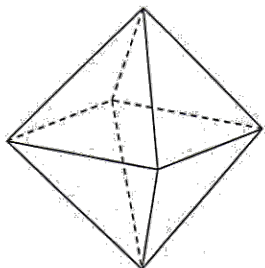
Tetrahedron

is there any high precision numerical study by TN?

... a vanguard for TN study



an extensive calculation suggests that there is only a phase transition



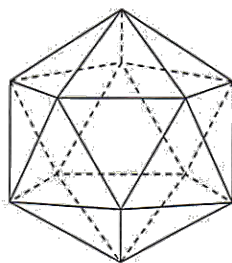
Octahedron

MC 2nd Order
[Surungan&Okabe, 2012]



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

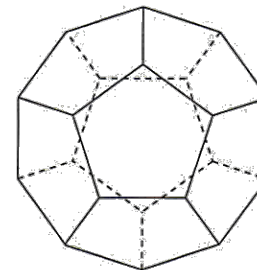
CTMRG



Icosahedron

2nd Order
[Patrascioiu, et al., 2001] **MC**
arXiv:[hep-lat/0008024](https://arxiv.org/abs/hep-lat/0008024)

[Surungan&kabe, 2012] **MC**
arXiv:[1709.03720](https://arxiv.org/abs/1709.03720)



Dodecahedron

KT? **MC**

[Patrascioiu, et al., 1991]



2nd Order **MC**
[Surungan&Okabe, 2012]

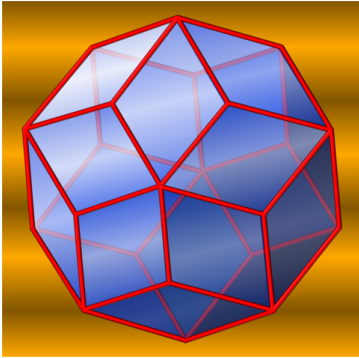
arXiv:[1709.03720](https://arxiv.org/abs/1709.03720)

CTMRG

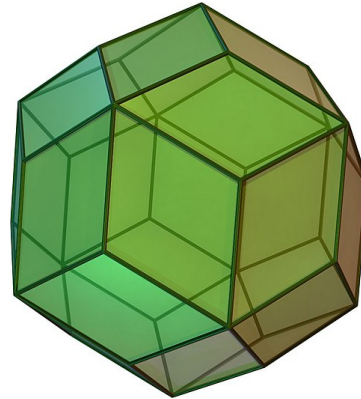
arXiv:[2004.08669](https://arxiv.org/abs/2004.08669)

Future studies

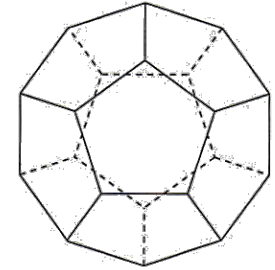
24 state



30 state

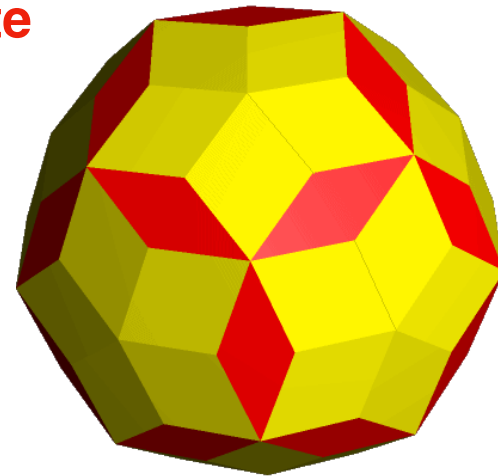


Current Target



Dodecahedron

90 state



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

a Generalization to

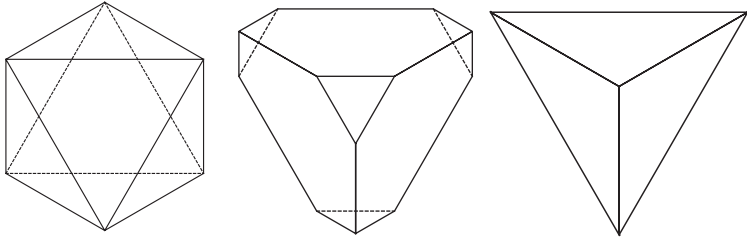
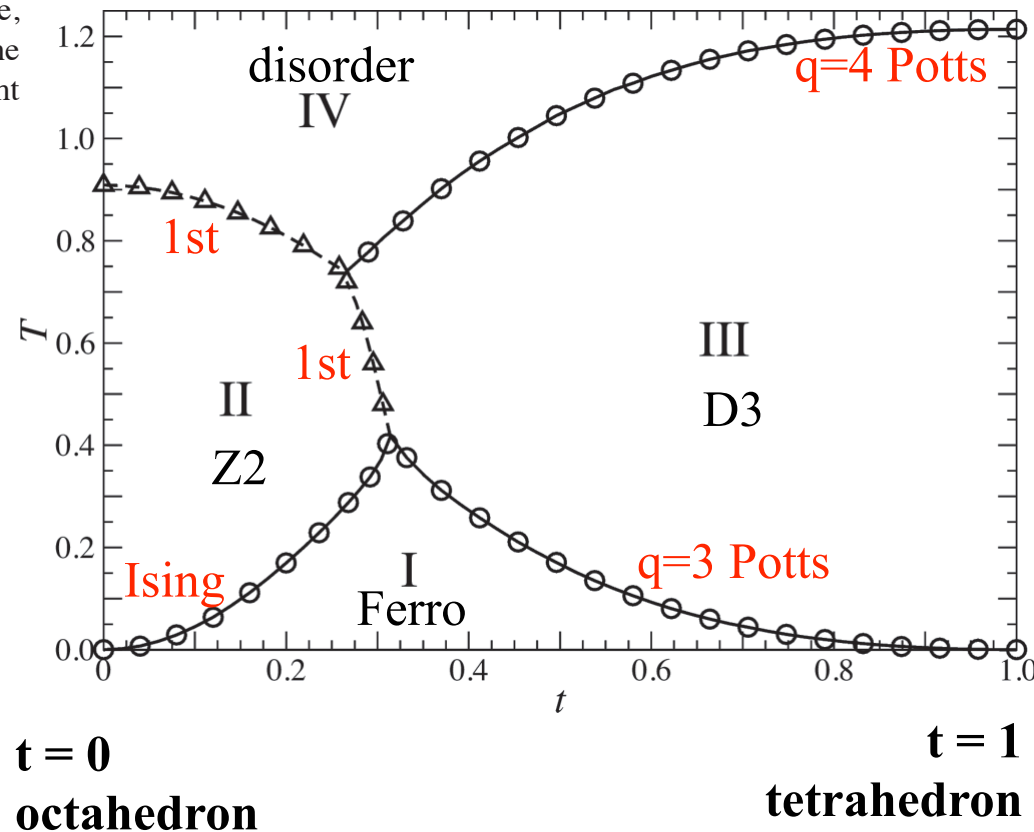
Truncated Tetrahedron Model ($q=12$)

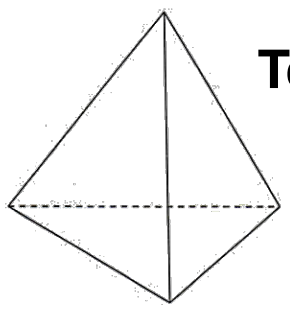
FIG. 1. Truncated tetrahedron (shown in the middle, parametrized by $t = 0.5$) is depicted as the interpolation between the octahedron (on the left for $t = 0$) and the tetrahedron (on the right for $t = 1$).

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

each site vector points to one of the vertices.



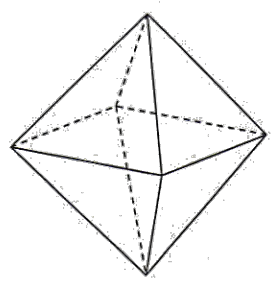
Higher Dimension (inner space)



Tetrahedron

>>> **n-simplex** (in $n+1$ dim.)

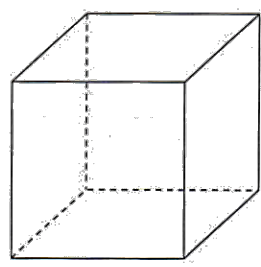
n-state Potts Model



Octahedron

>>> **16-cell, 32, 64, ...**

n-set of Ising Model



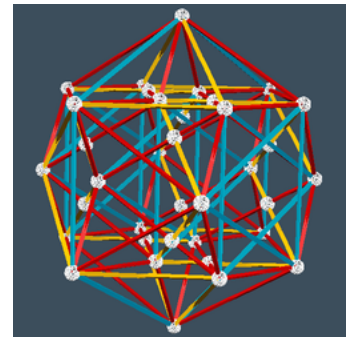
Cube

>>> **Hyper Cube**

Akiyama et al, arXiv:1911.12978

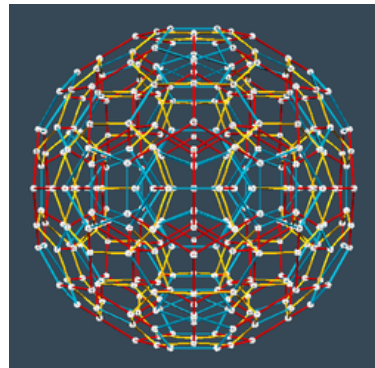
Weak First Order? in 4D??

Characteristic 4-polytopes



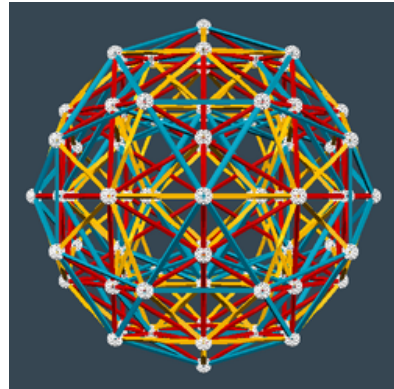
24-cell

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



120-cell

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)

Tensor Networks for Statistical Mechanics

Tomotoshi. Nishino (Kobe University)

Part II. 17:00 PM (Kobe), 24 Feb. 2021

Fractal lattice (just glance at)

Crystal Surface (**Disordered Flat** phase, Steps, etc.)

Polygon and Polytope Models

Hyperbolic lattices (optional)

Random-bond Ising model (optional)

Ads from Okunishi: Coming Workshop in March

<http://www2.yukawa.kyoto-u.ac.jp/~qith2021/index.php>