

When entanglement entropy tends (*not*) to diverge

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Entanglement entropy $S = -\text{Tr} \rho \ln \rho$

Keywords

- (1) **Tensor-Network** studies of spin systems in the thermodynamic limit.
- (2) **Phase-transition** analysis using ground-state properties.
- (3) **Fractals** and negative (**hyperbolic**) curvature.

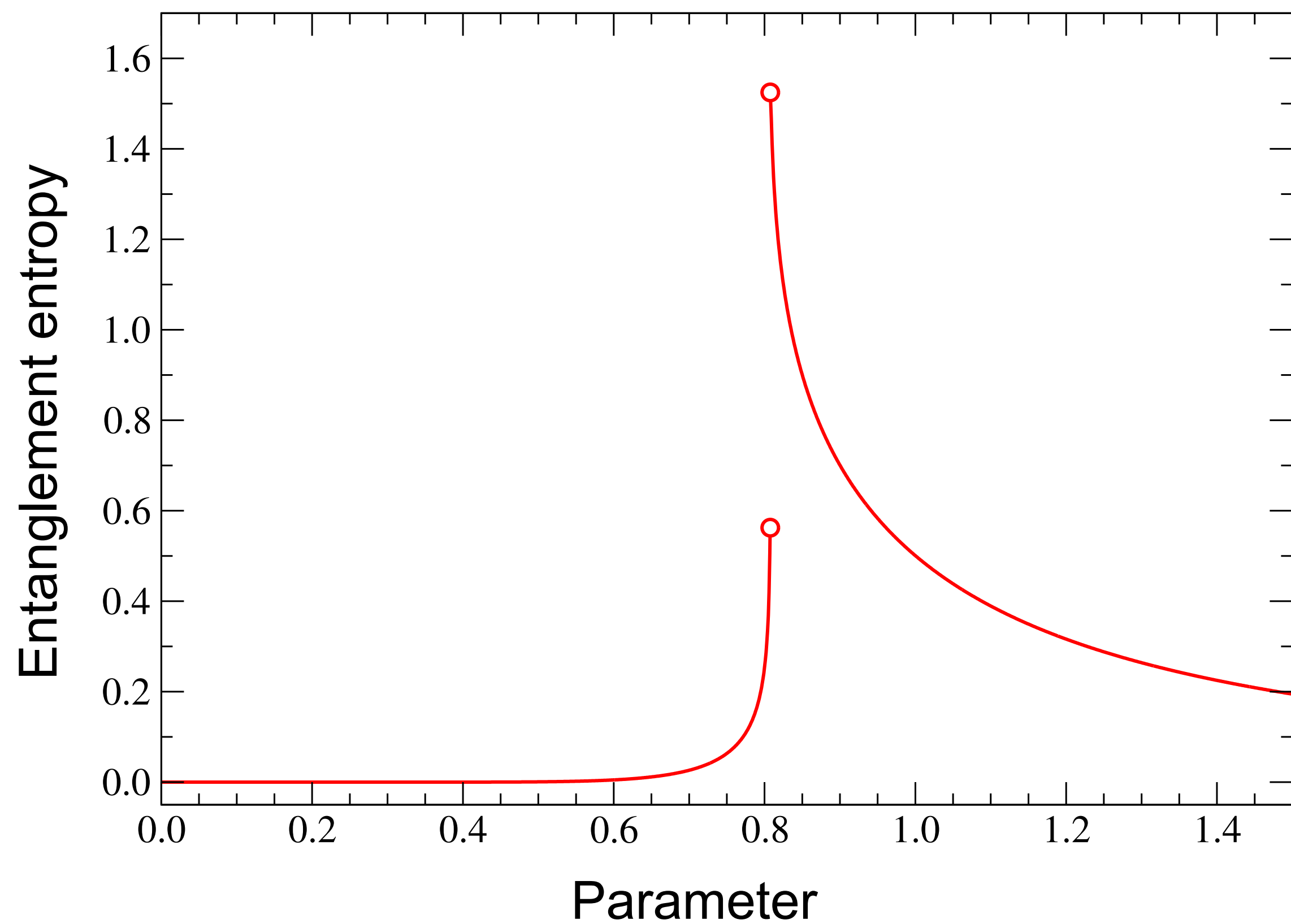
Part I

Motivation

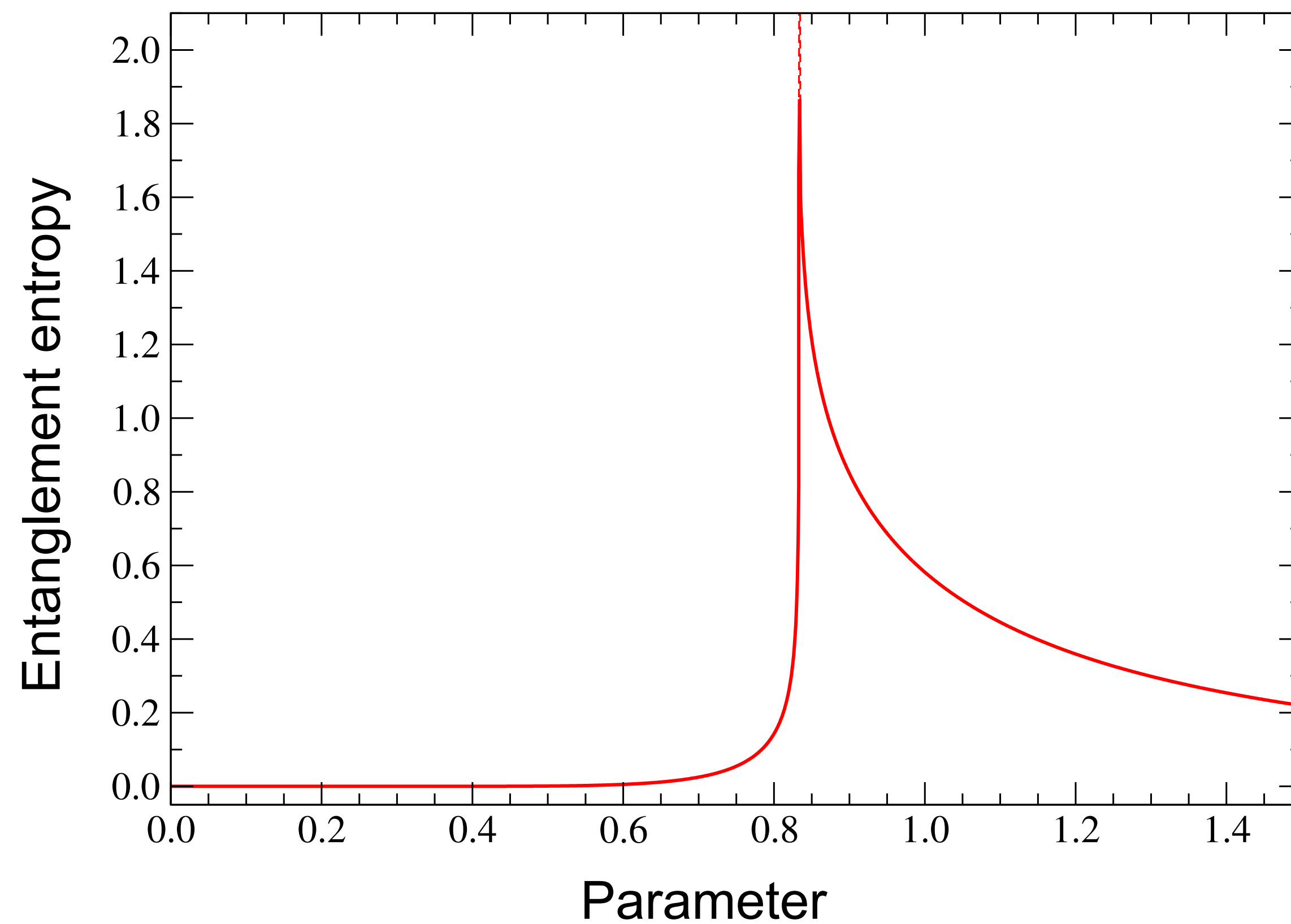
- Physics at maximum entanglement entropy
- Criticality and phase transitions

Discontinuous and continuous phase transitions

1st order phase transition
(discontinuous)

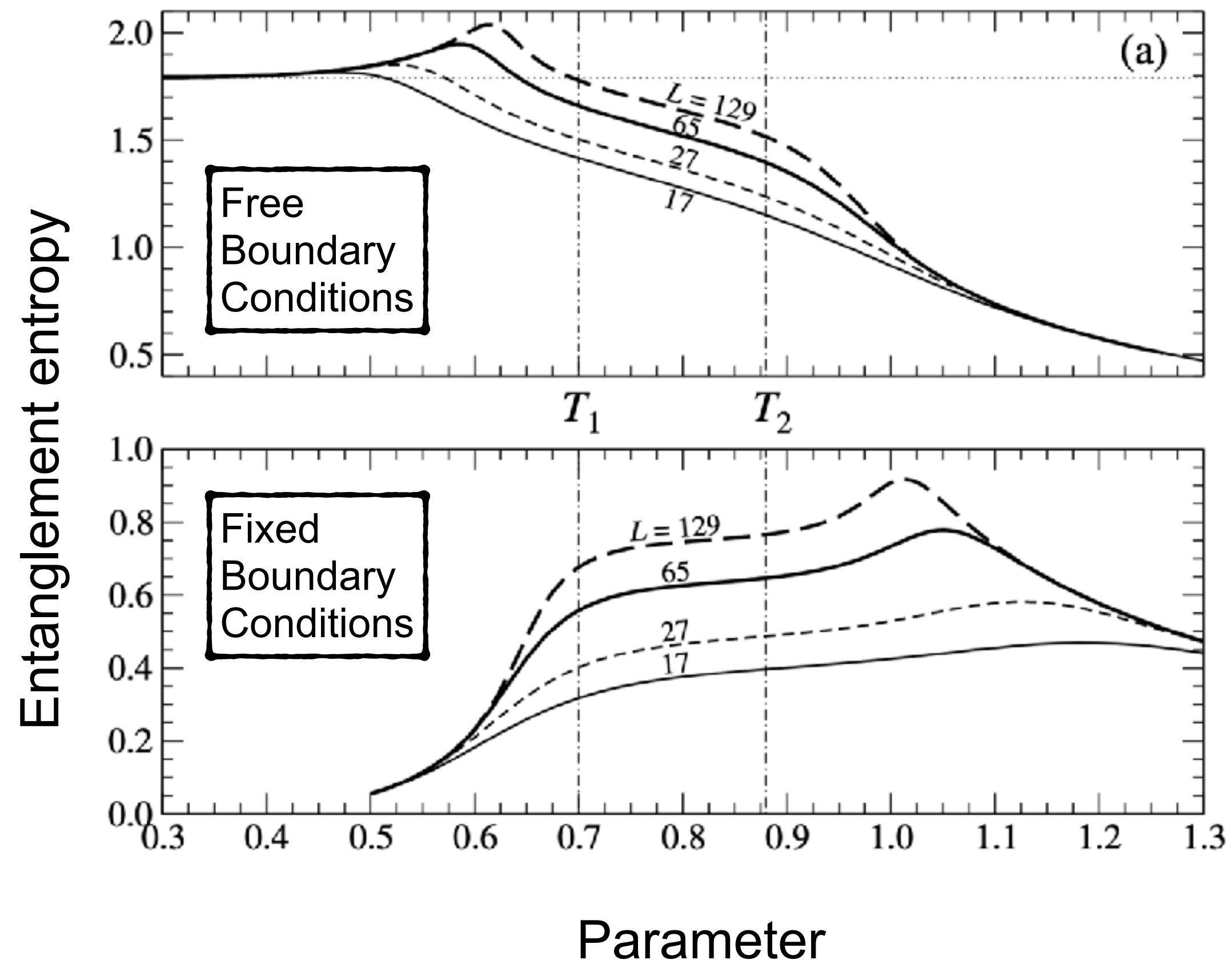


2nd order phase transition
(continuous)

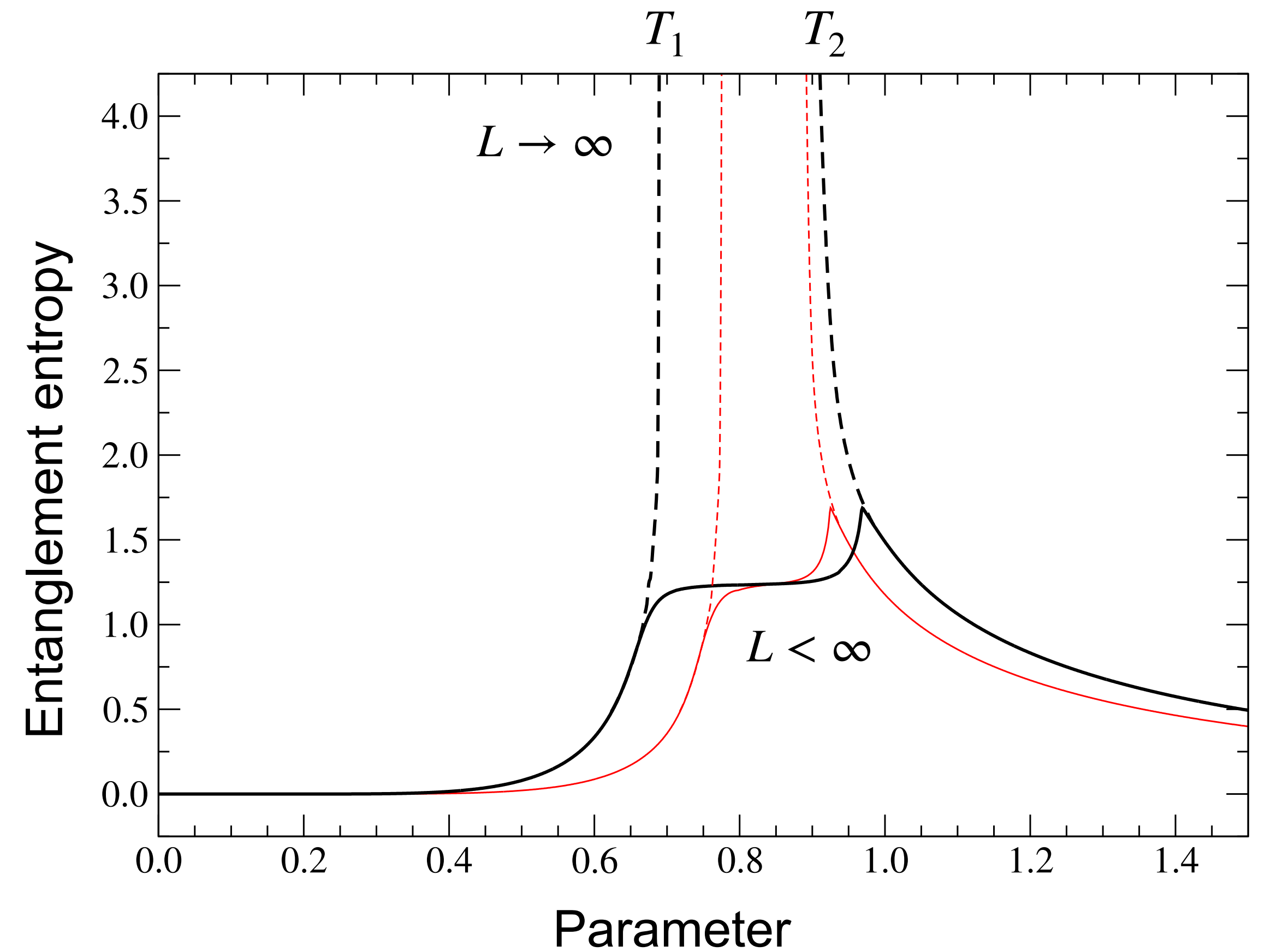


Berezinskii-Kosterlitz-Thouless phase transition

∞^{th} order phase transition

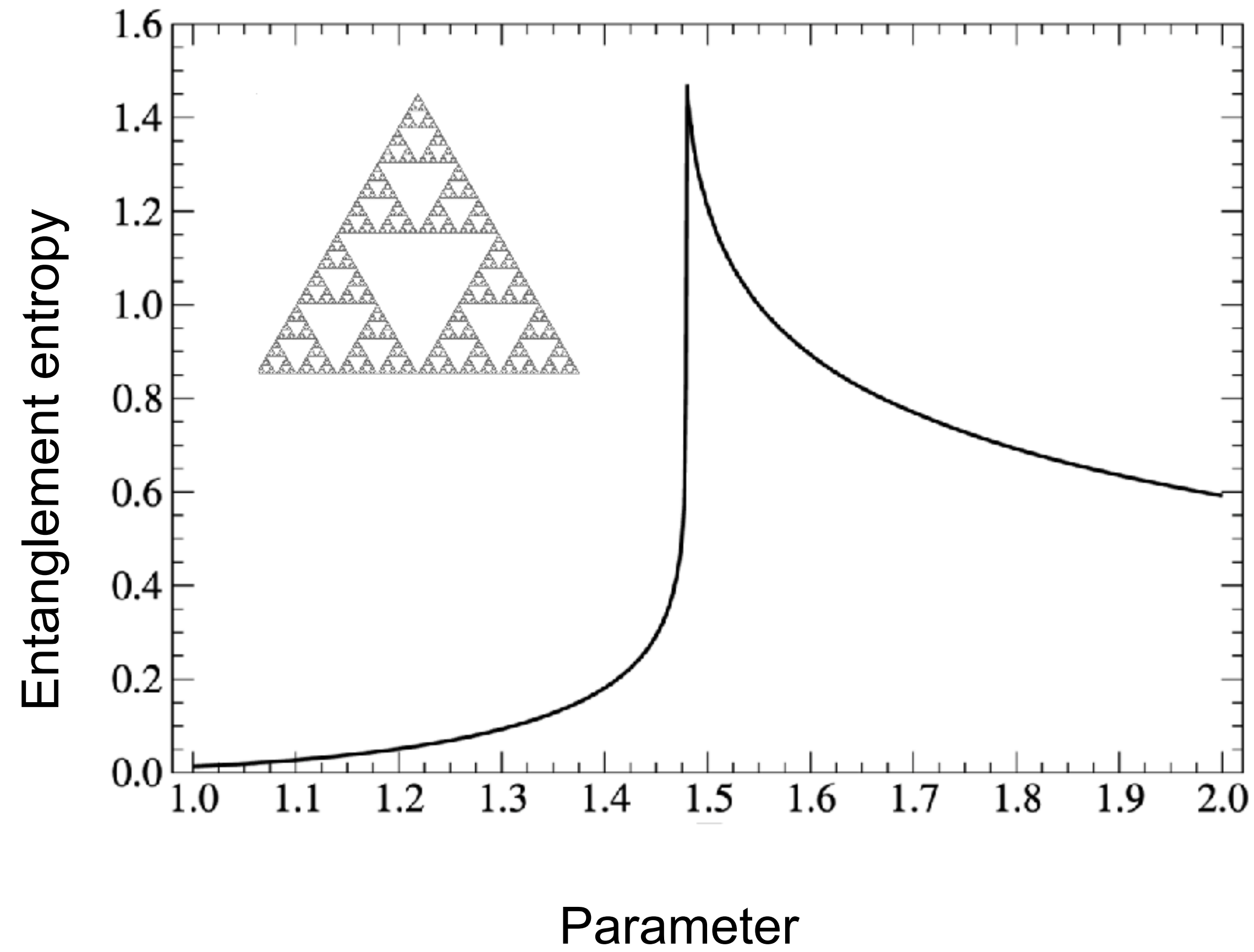


∞^{th} order phase transition

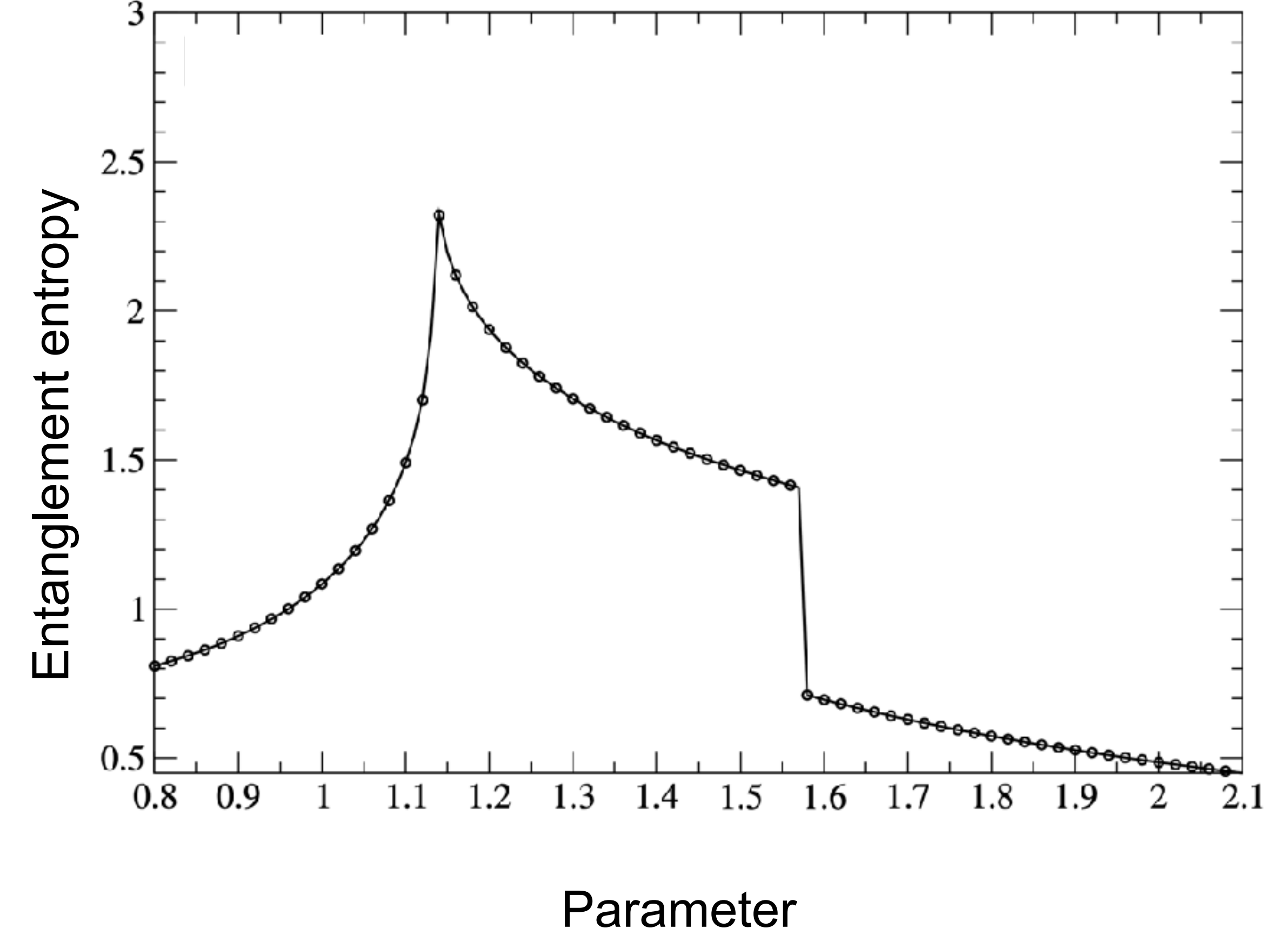


*Continuous phase transition on **fractals***

2nd order phase transition

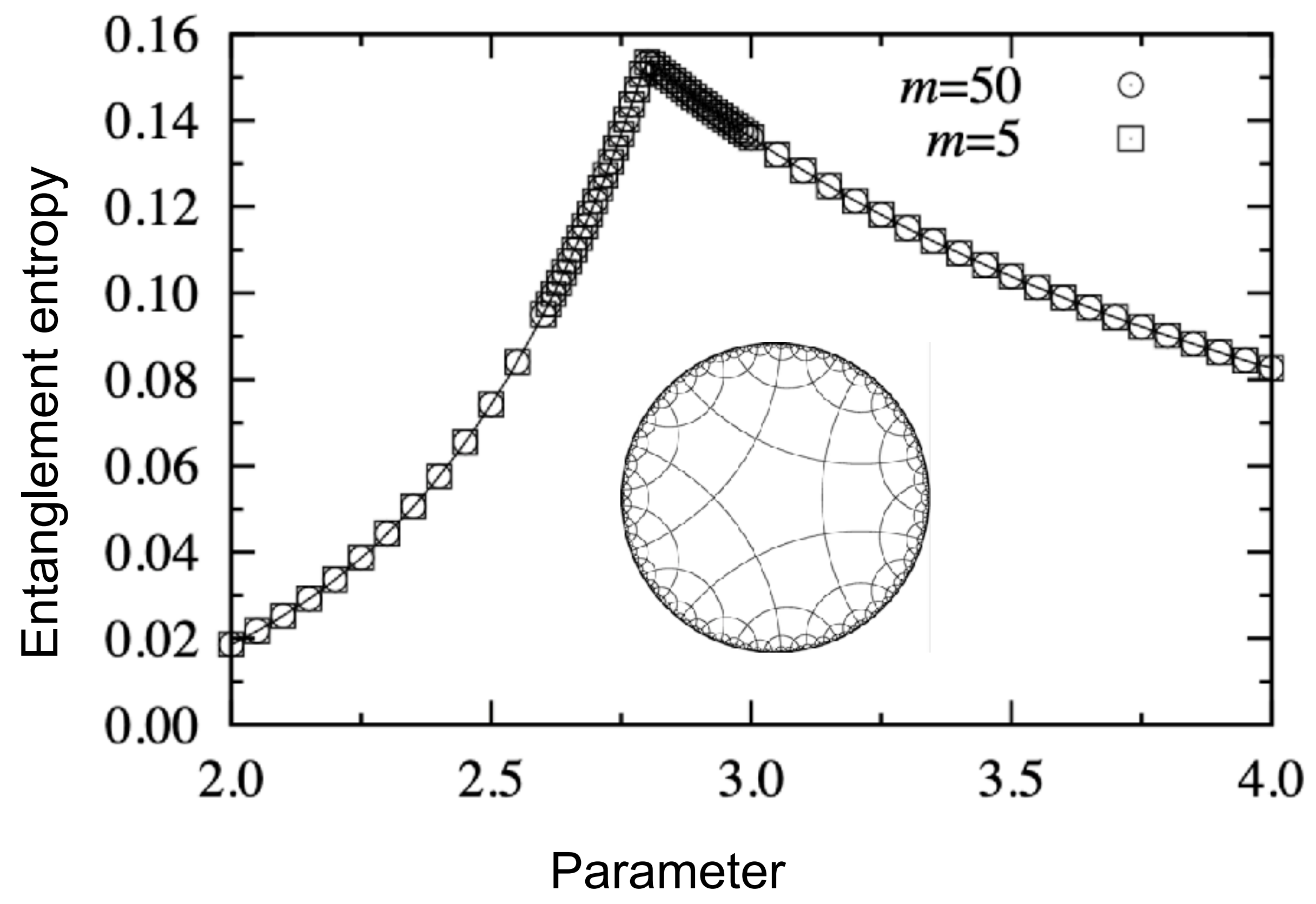


2nd order phase transition

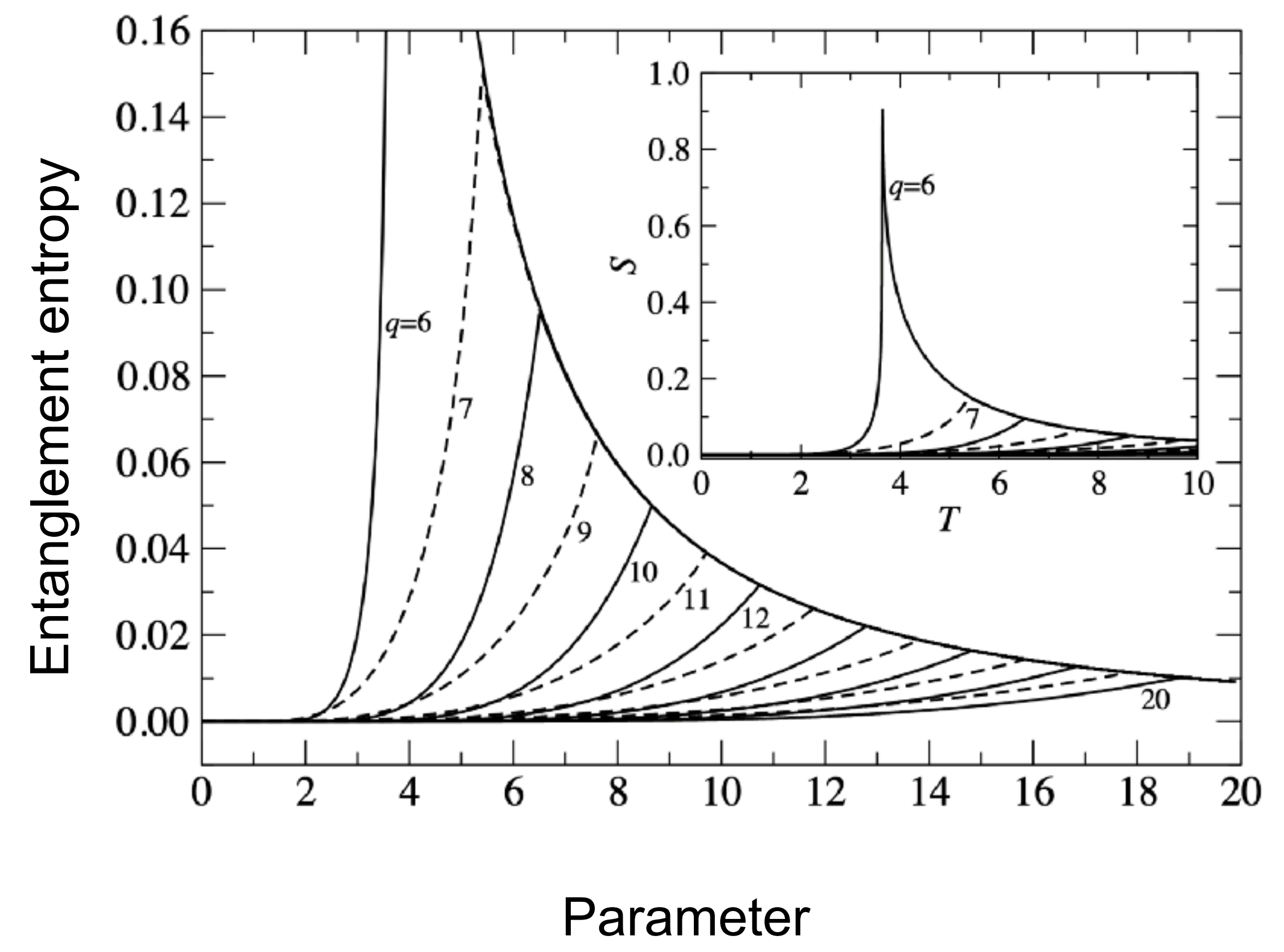


Continuous phase transition in *hyperbolic* space

2nd order phase transition



2nd order phase transition

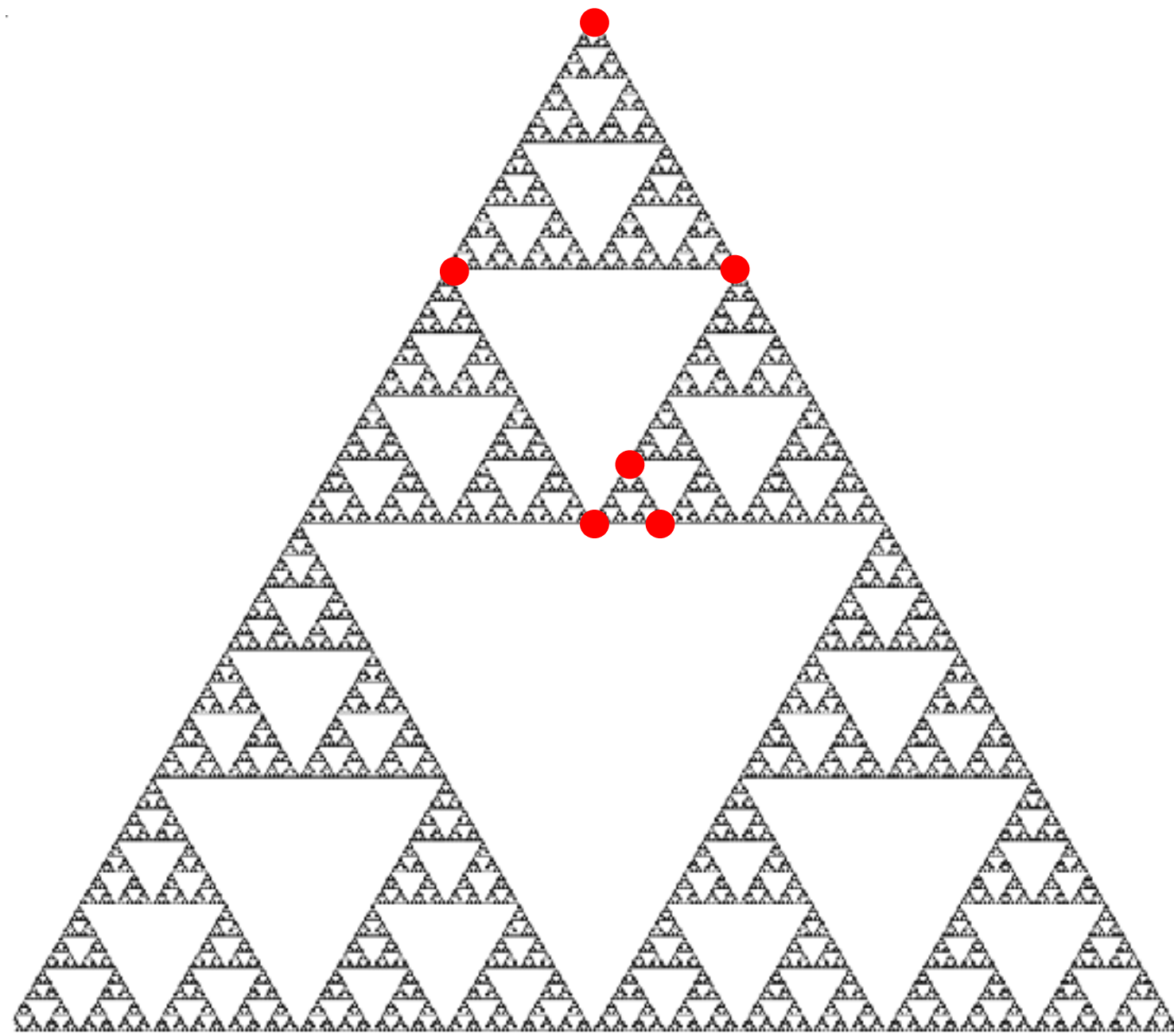


Entanglement entropy of

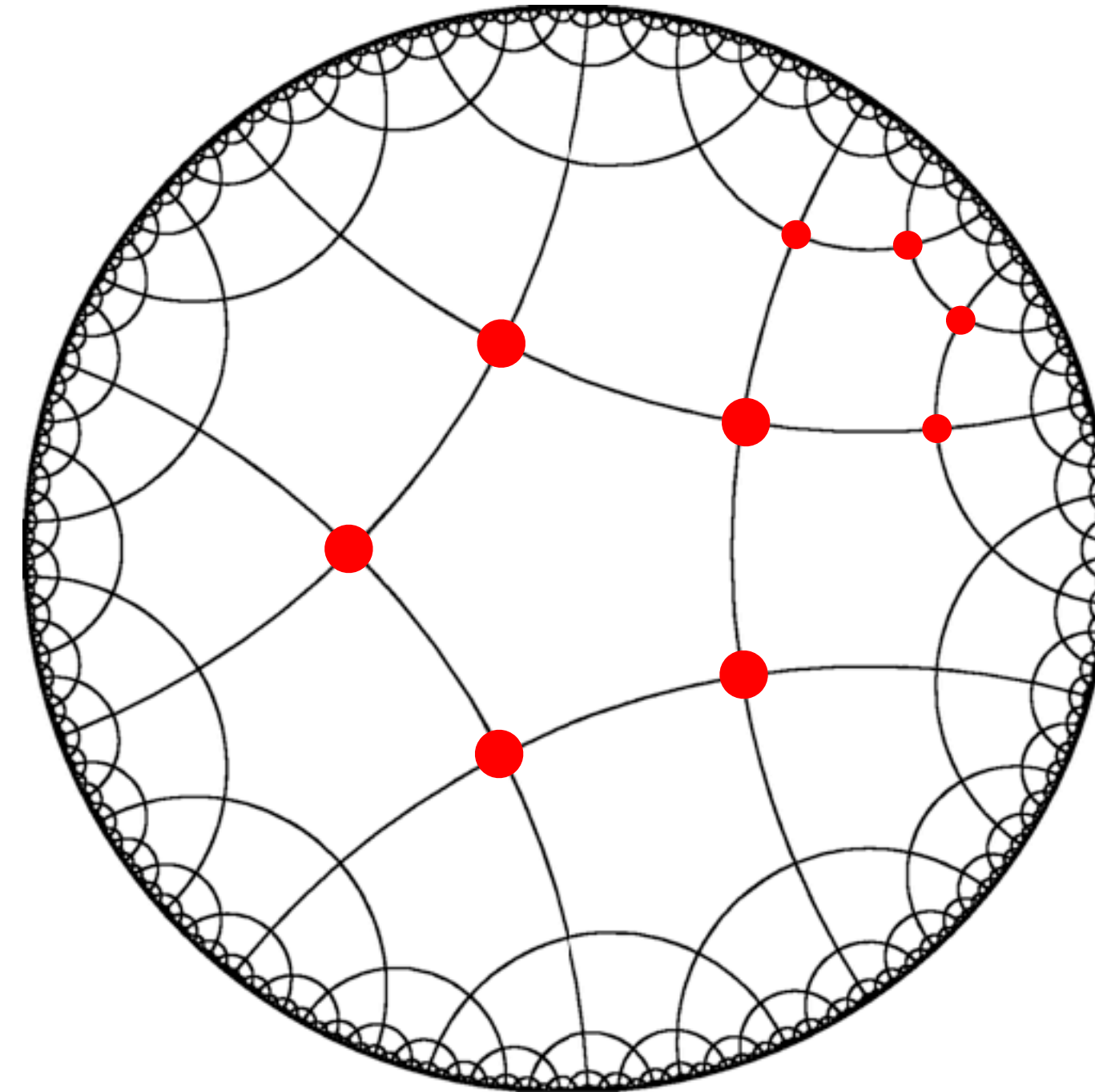
- **Part II** fractal lattices
- **Part III** hyperbolic lattices

- Focus on **two** types of lattice systems, where spins can interact.
- Classical and quantum spin models (example are shown in 2D).

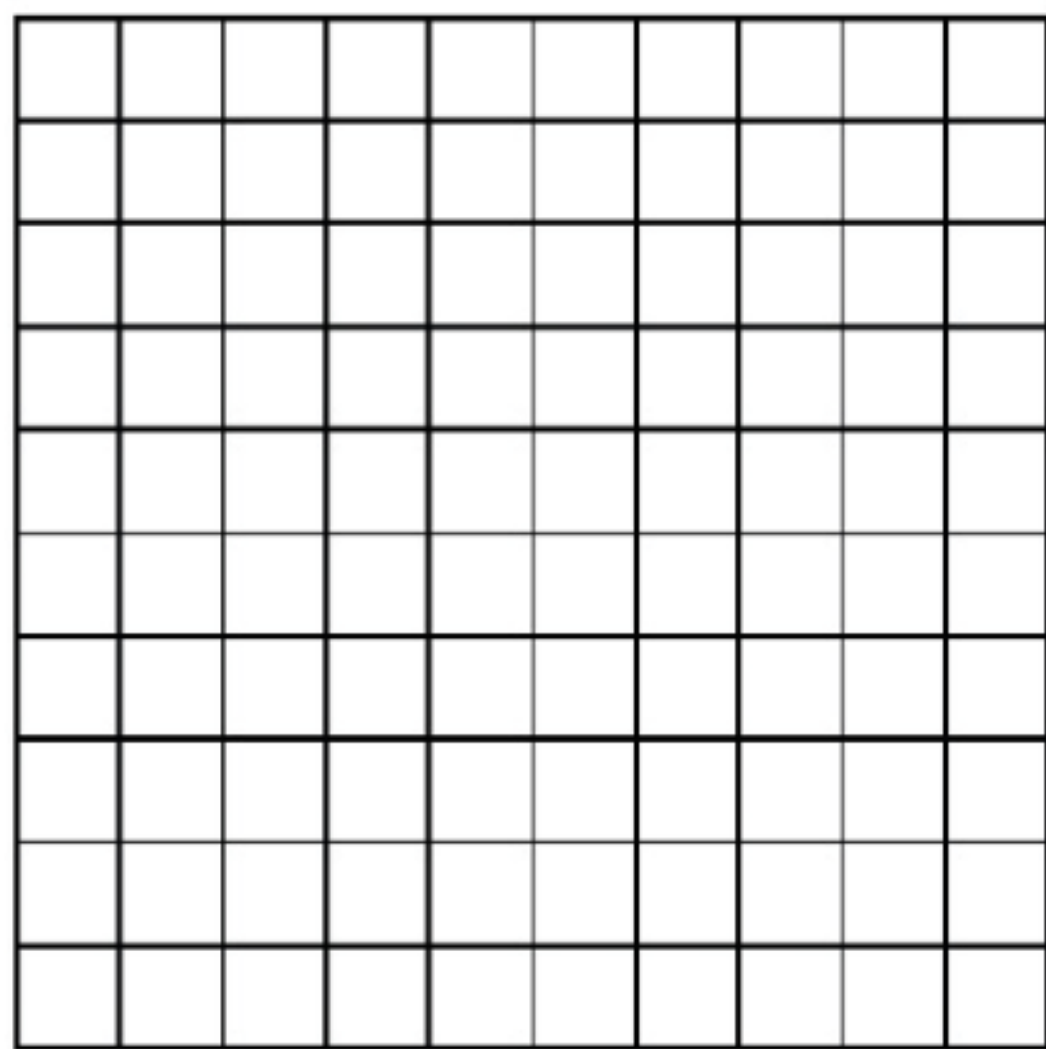
Infinite **fractal** lattices



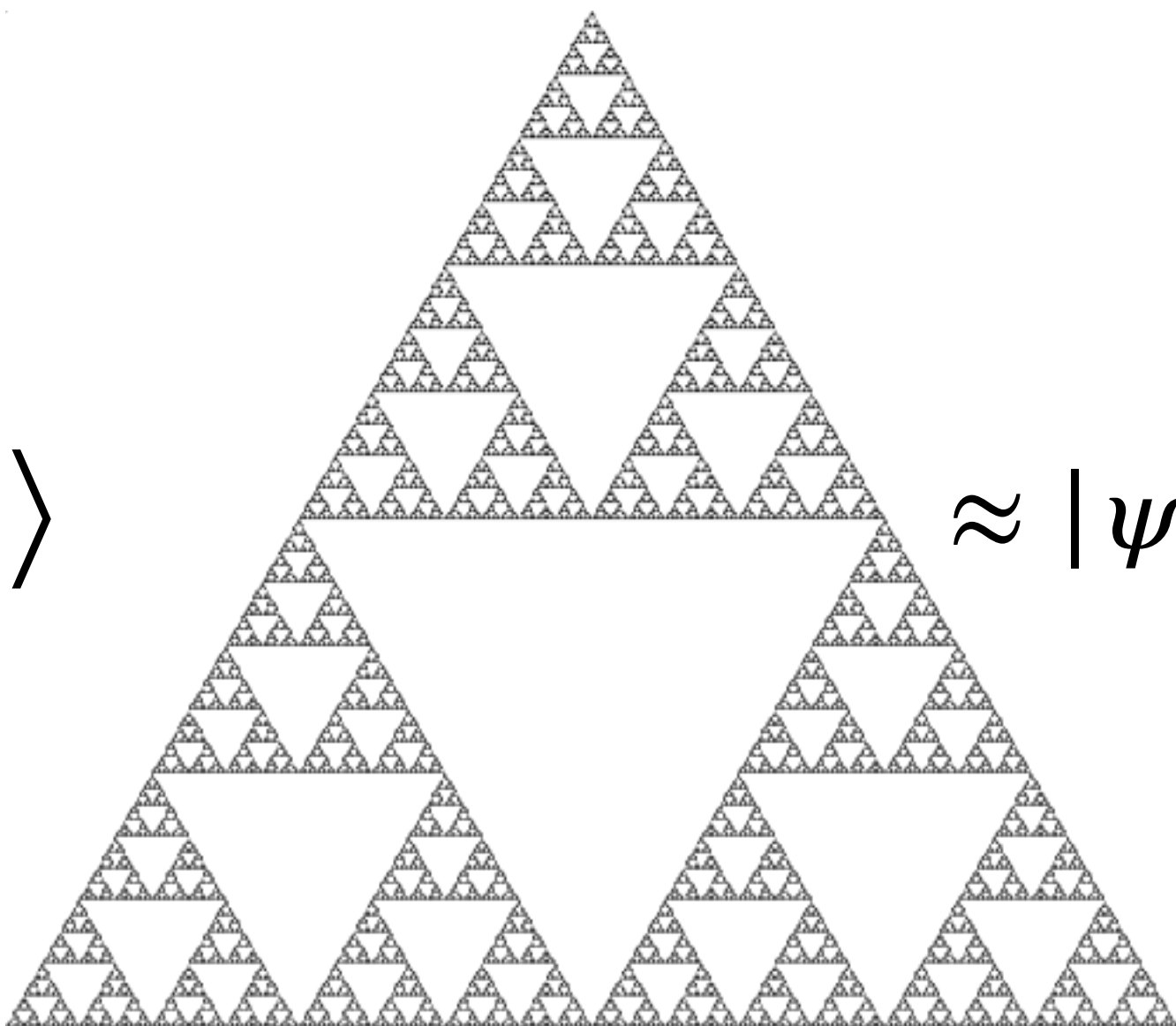
Infinite **hyperbolic** lattices



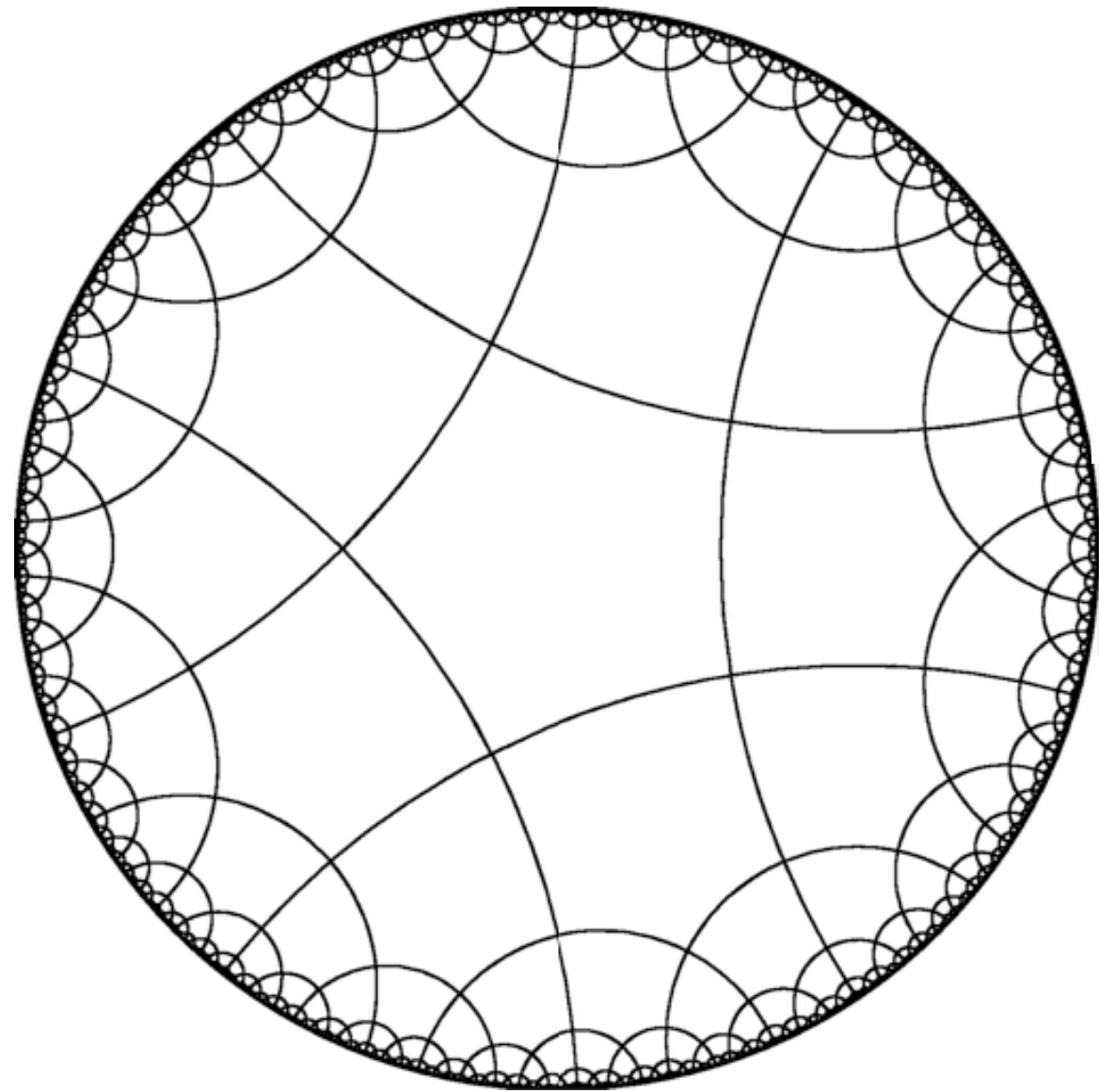
Tensor-Network analysis provides access to more complex systems.
We use it as a robust **tool** for developing novel concepts for physics.
Let us restrict to ground state $|\psi_0\rangle$ and the strongest entanglement.



$\approx |\psi_0\rangle$



$\approx |\psi_0\rangle$



$\approx |\psi_0\rangle$

Square lattice
(Euclidean space)

$$d_H = 2$$

Fractal lattice
(Self-similarity)

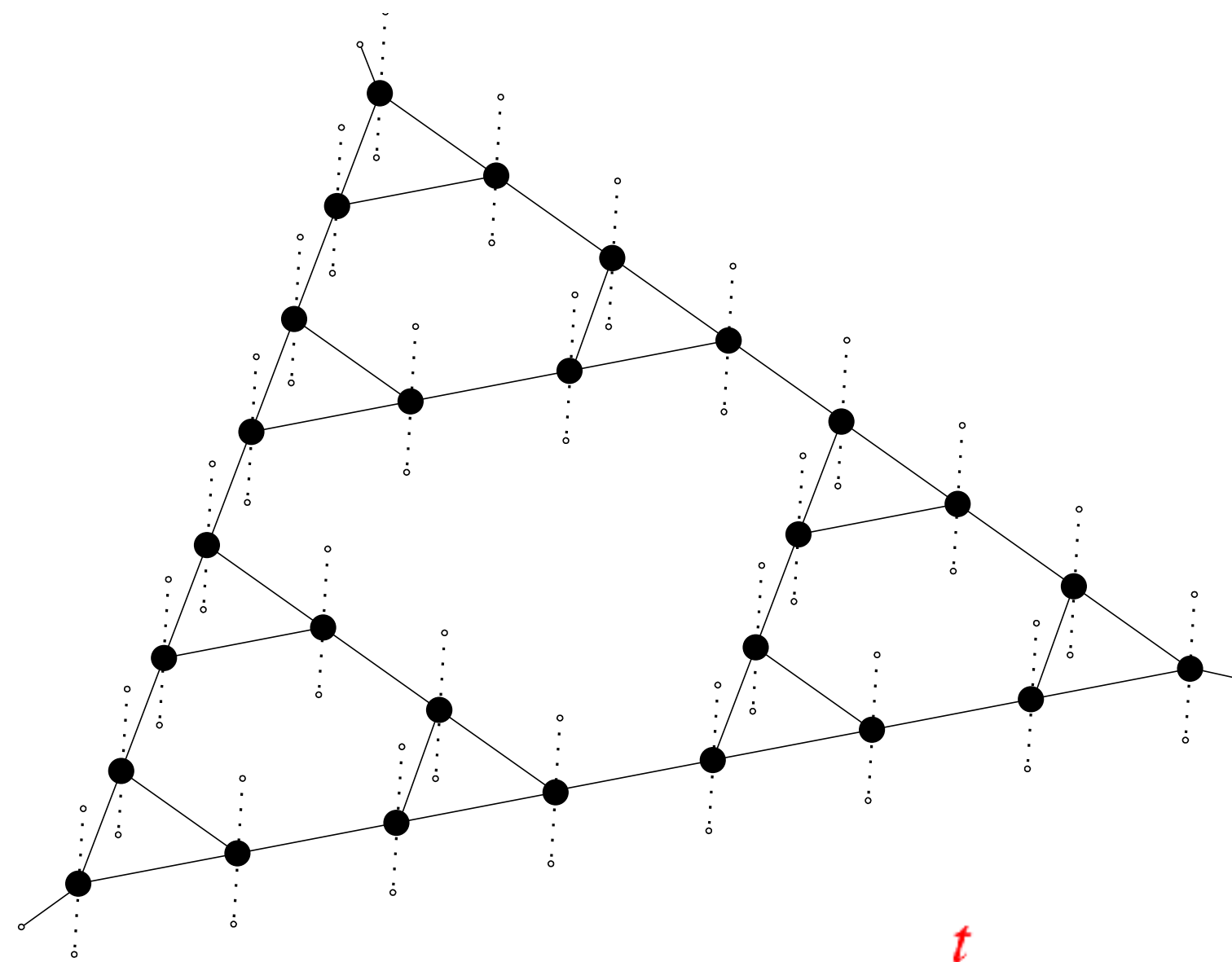
$$d_H = 1.585\dots$$

Hyperbolic lattice
(non-Euclidean space)

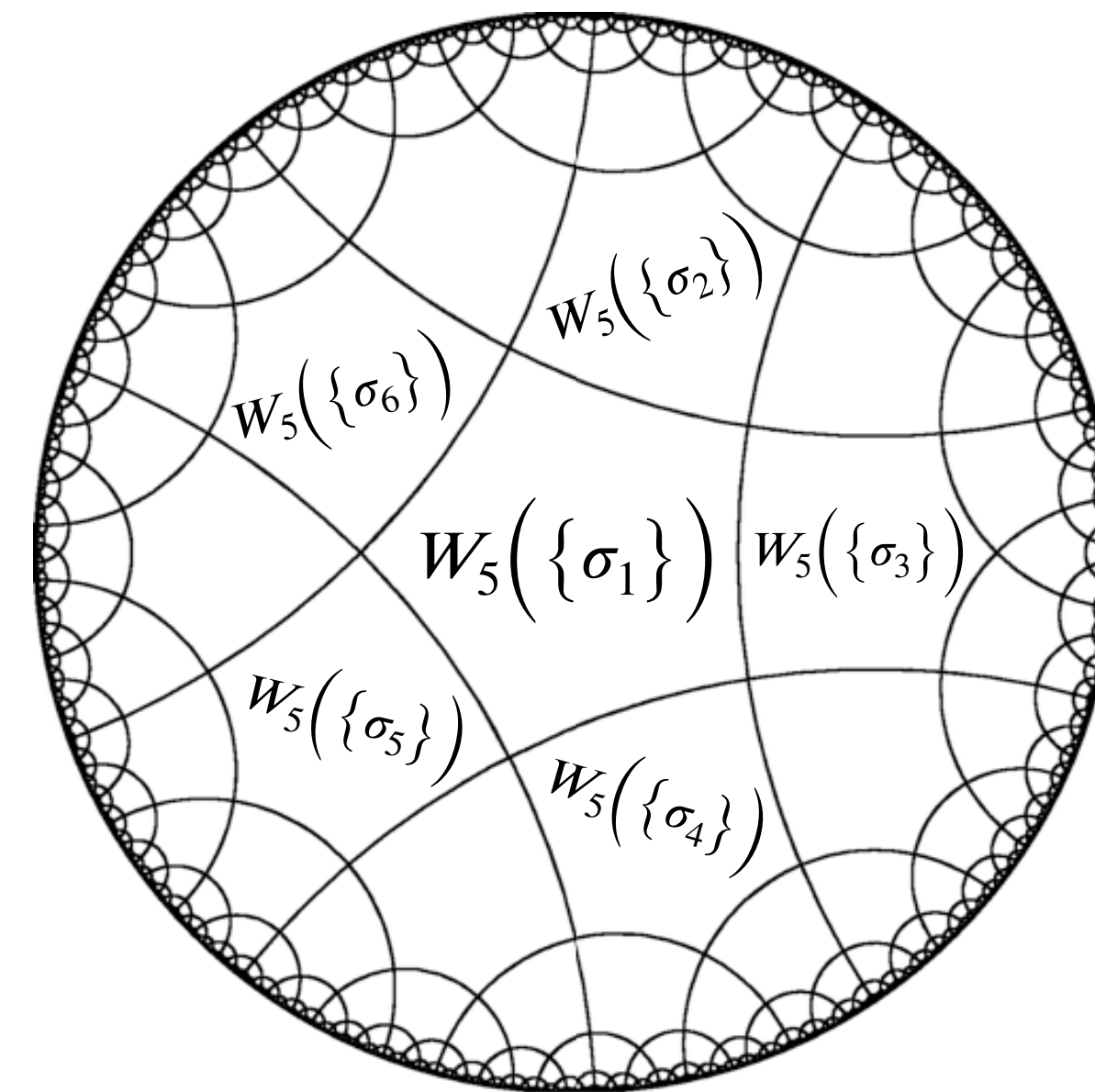
$$d_H \rightarrow \infty$$

Three generalized Tensor-network algorithms used:

1. Tensor Product Variational Approximation (TPVA)
2. Higher-Order Tensor Renormalization Group (HOTRG)
3. Corner Transfer Matrix Renormalization Group (CTMRG)



$$W_{ijk,ts} = \begin{array}{c} t \\ \vdots \\ k \text{---} \bullet \text{---} j \\ \vdots \\ s \end{array}$$



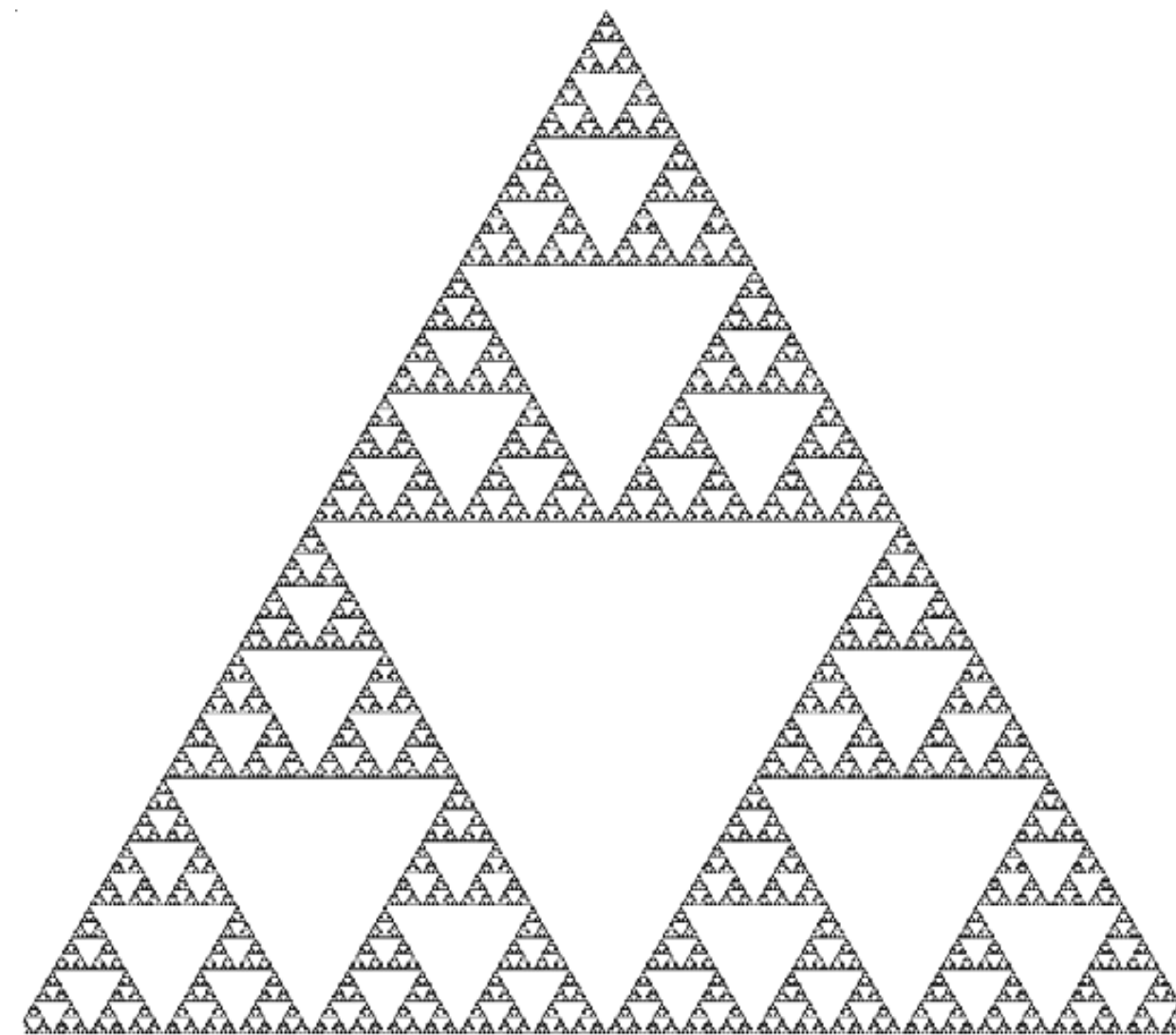
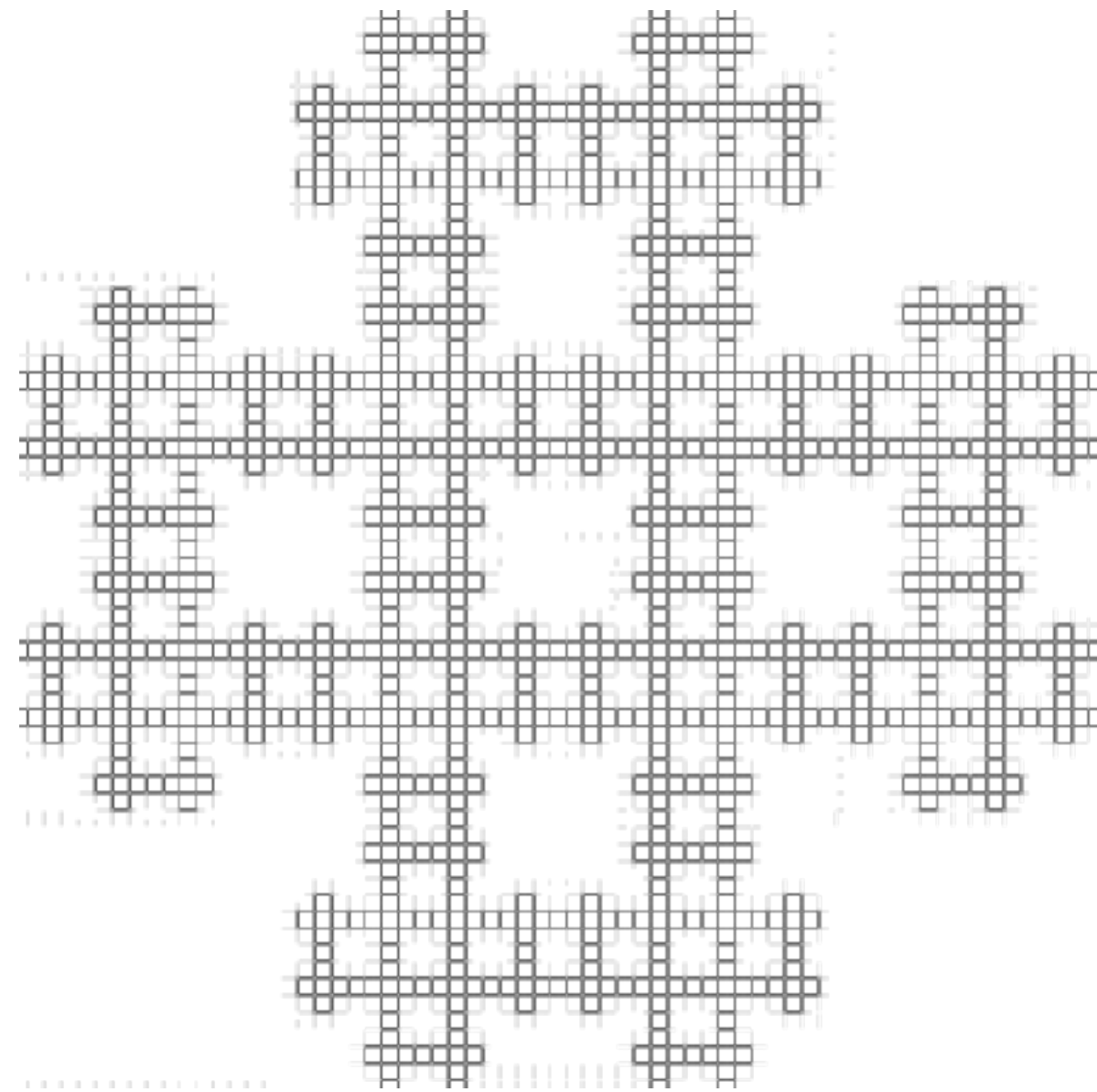
$$|\psi_{(p,q)}\rangle := |\psi_p\rangle = \lim_{N \rightarrow \infty} \sum_{\{\sigma_1, \{\sigma_2\}, \dots, \{\sigma_N\}\}} \prod \langle k \rangle_p W_p(\{\sigma_k\}) |\sigma_1 \sigma_2 \dots \sigma_N\rangle$$

Part II

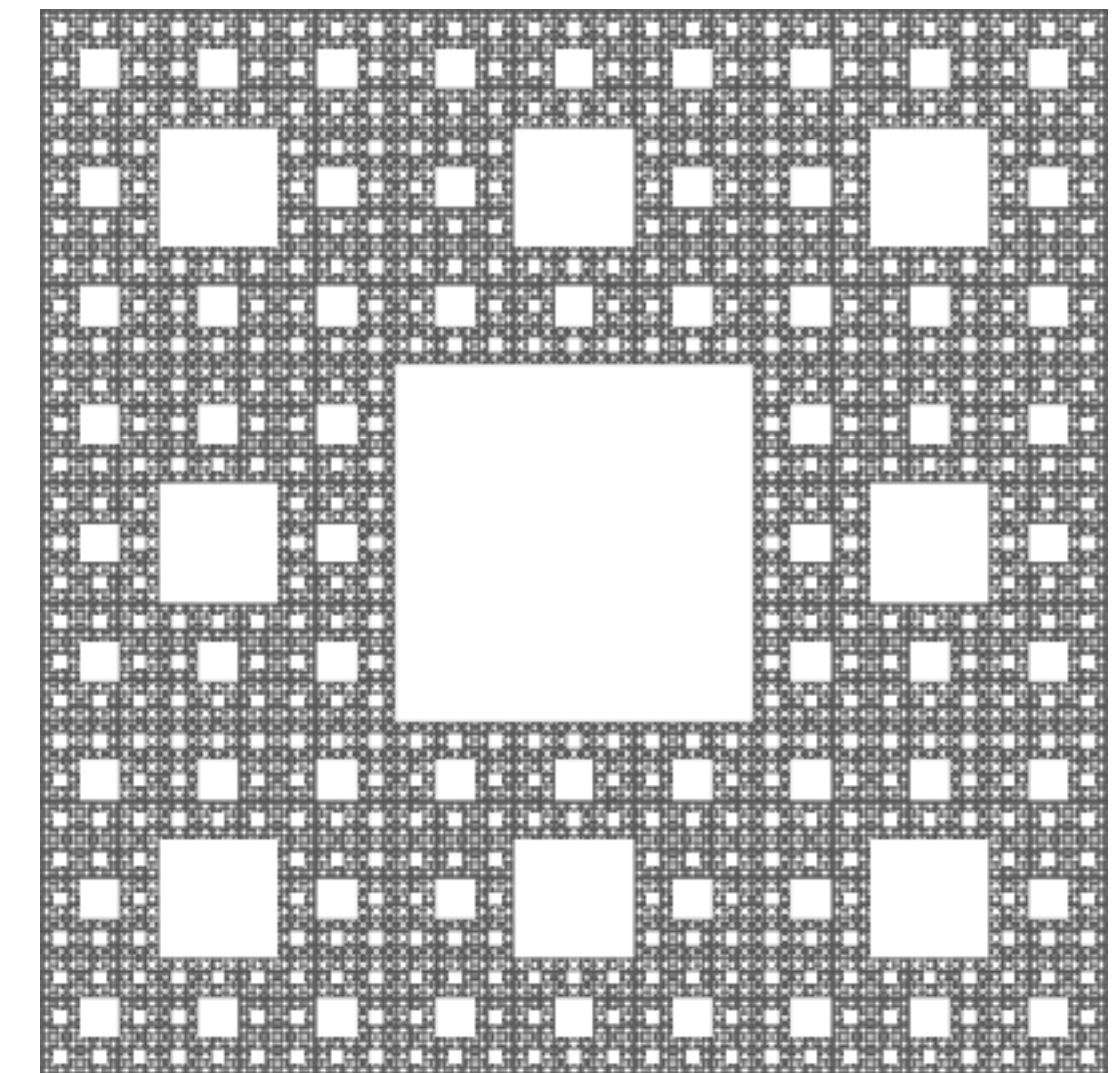
*Phase transitions on **fractals***

- classical and quantum spin models

Tensor networks designed to study fractals



No phase transition
(for classical spins)

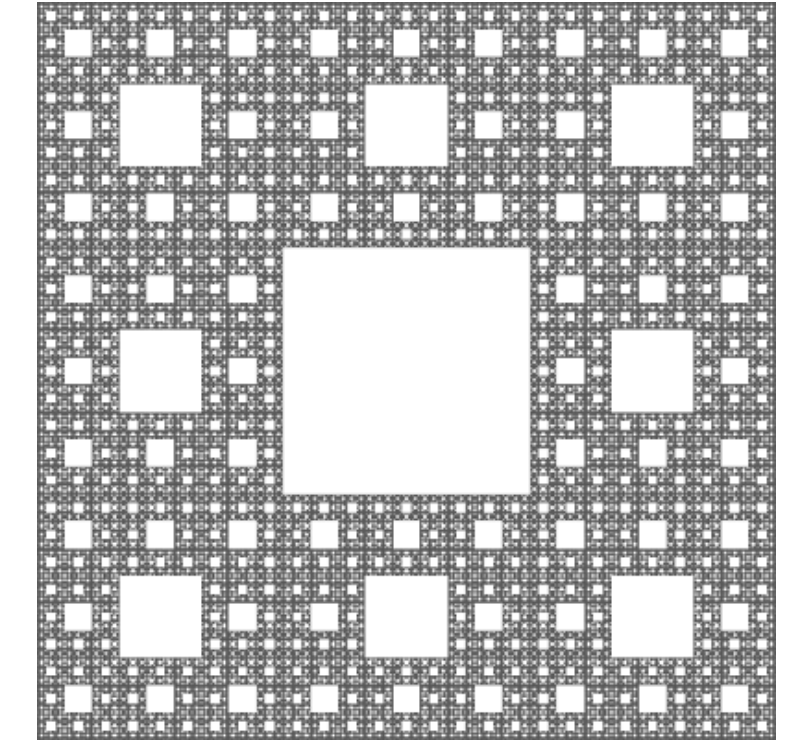


Fractal Dimension

What happens as we increase the linear-size (diameter) of the system?

L : linear-size magnification factor

N : volume-size multiplication factor

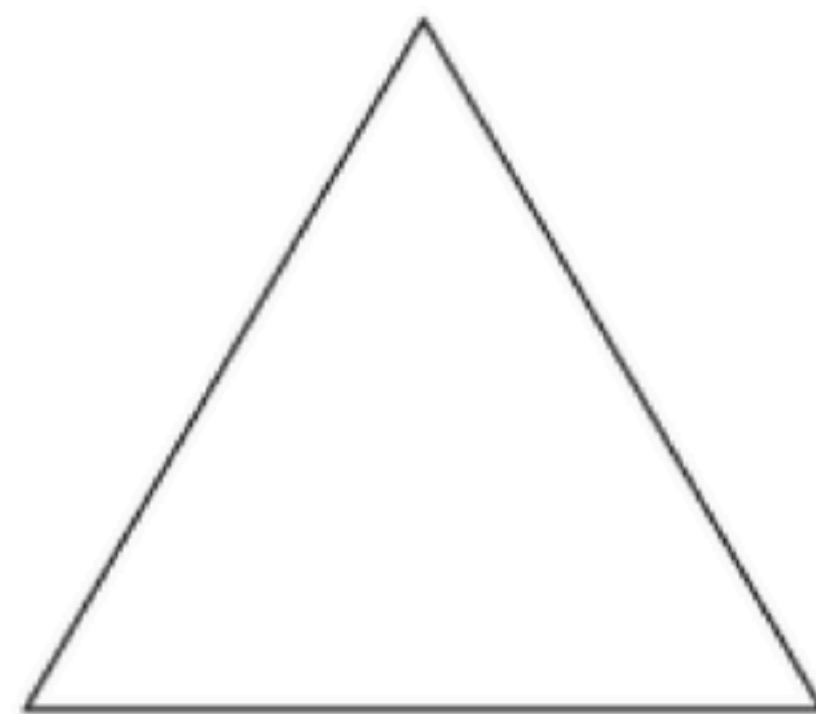


$$d_H = \frac{\ln 8}{\ln 3} \approx 1.893$$

Scaling of the volume (*Hausdorff* dimension): d_H

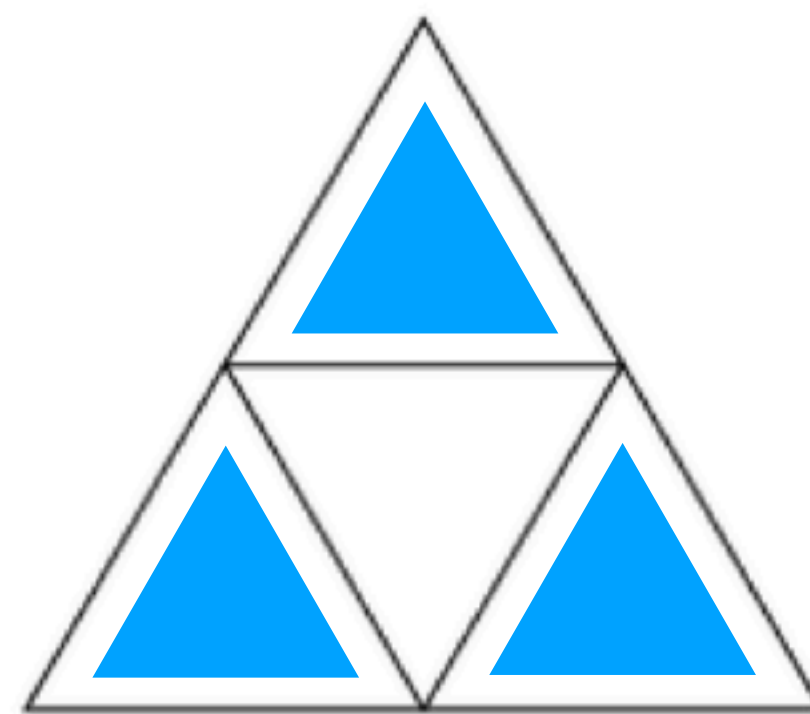
$$N = L^{d_H}$$

$$d_H = \frac{\ln N}{\ln L}$$



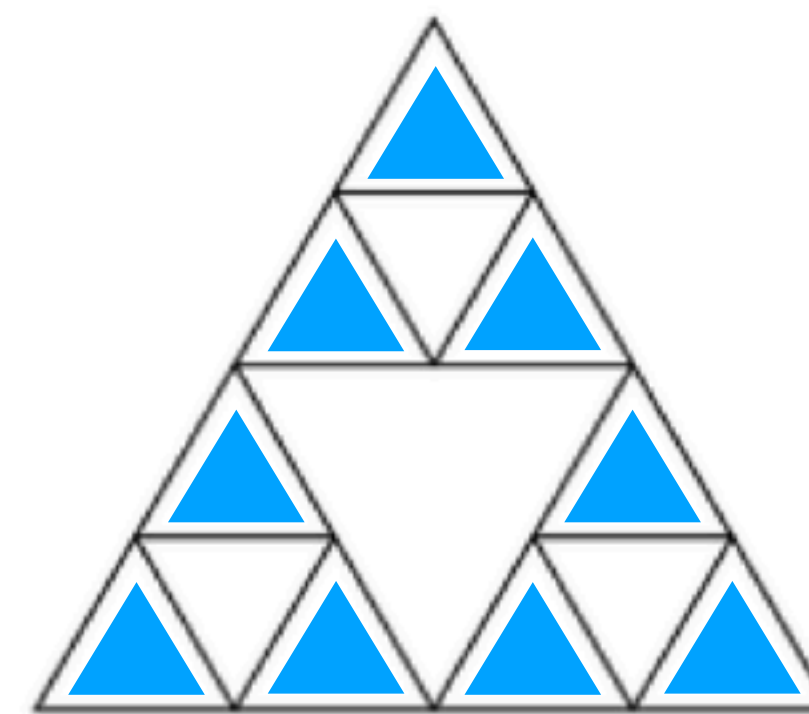
$$N = 3^0 = 1$$

$$L = 2^0 = 1$$



$$N = 3^1$$

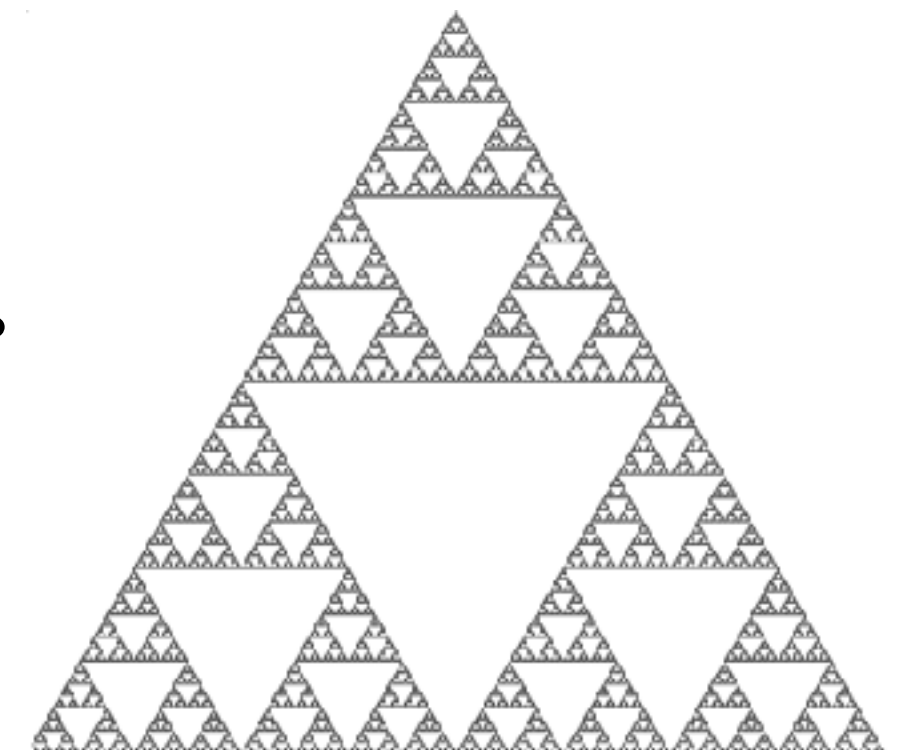
$$L = 2^1$$



$$N = 3^2$$

$$L = 2^2$$

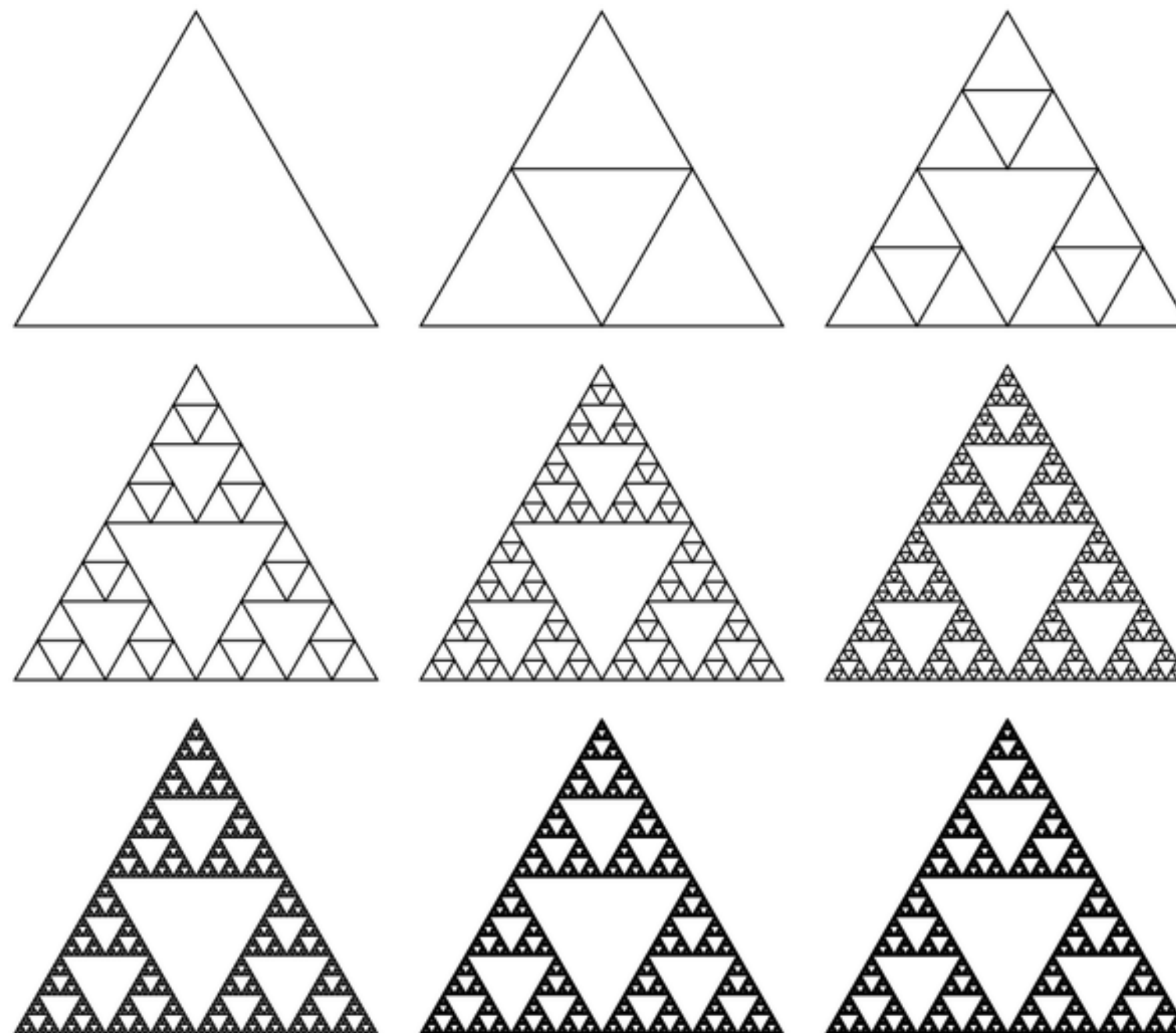
...



$$d_H = \frac{\ln 3^N}{\ln 2^N} \approx 1.585$$

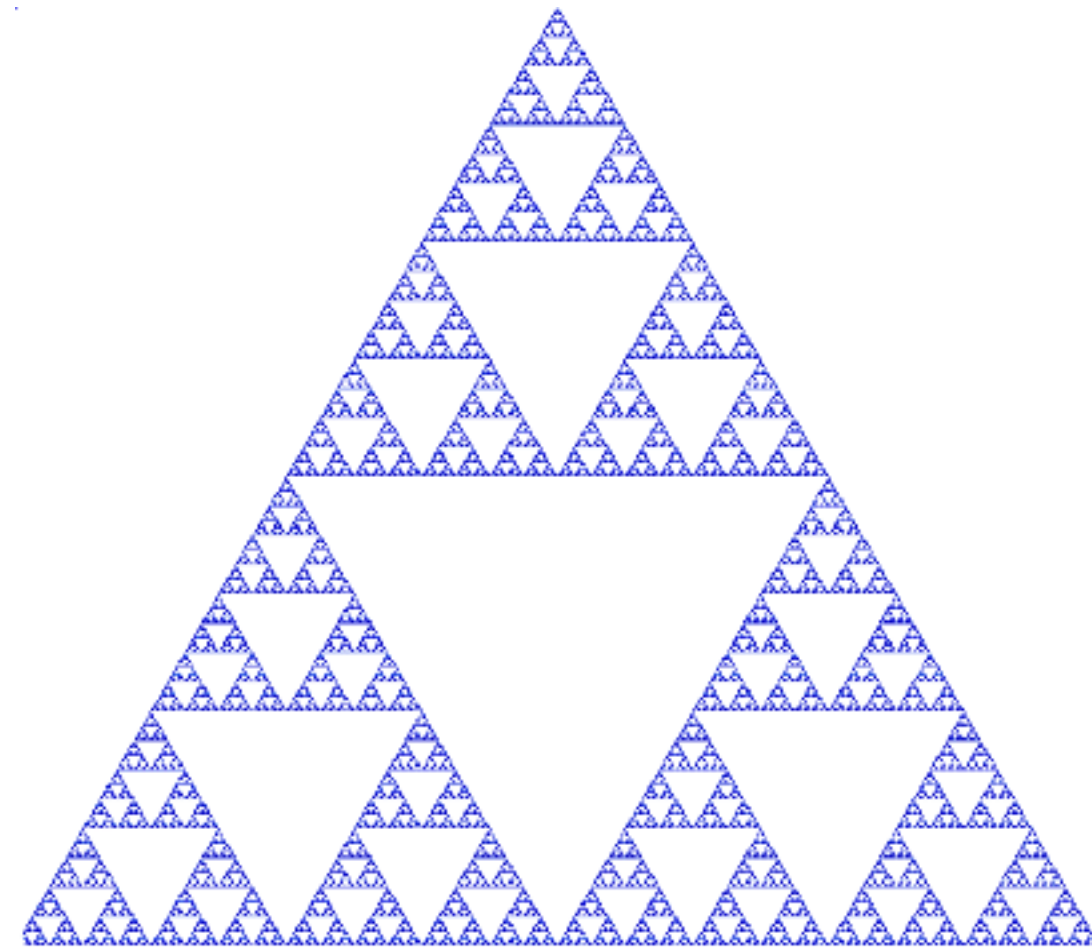
Self-similarity on an infinite lattice with spacings fixed to be finite and identical.

No phase transition exists for the **classical** Ising model on the **Sierpinski triangle** (gasket).
However, there is a phase transition for the quantum Ising model on this fractal.

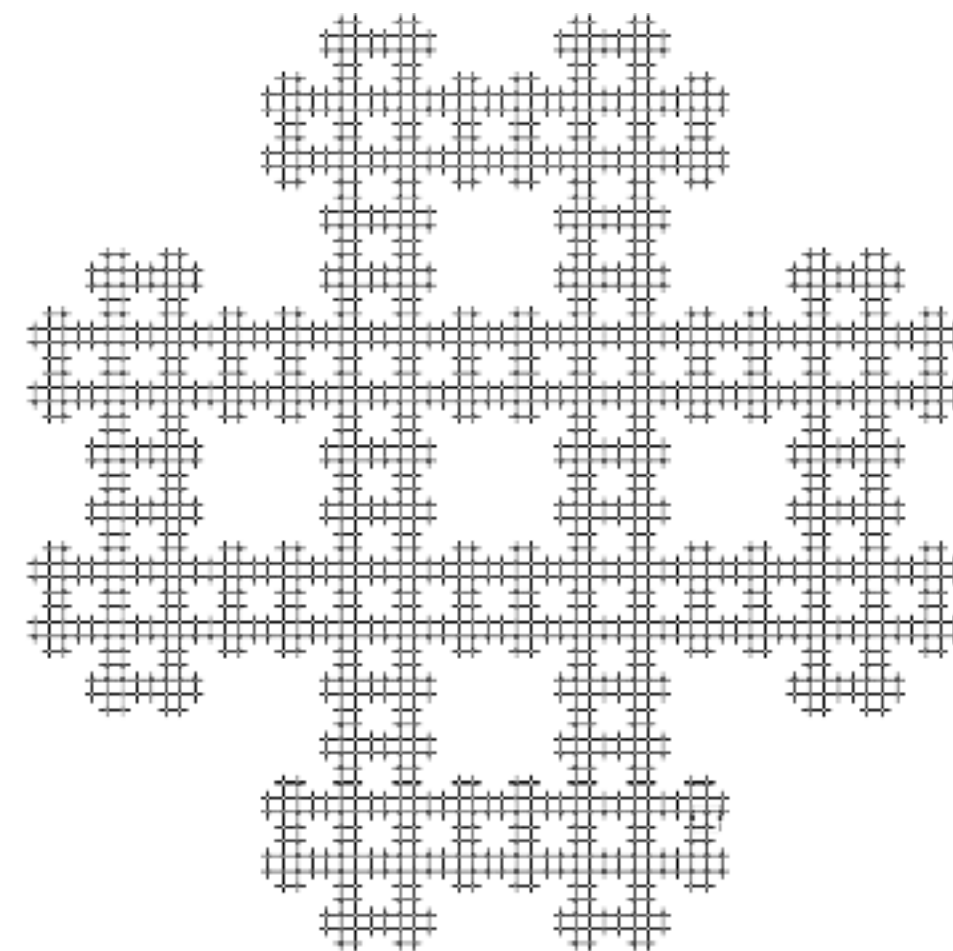


Fractal (Hausdorff) dimension: $d_H = \log_2 3 \approx 1.585$

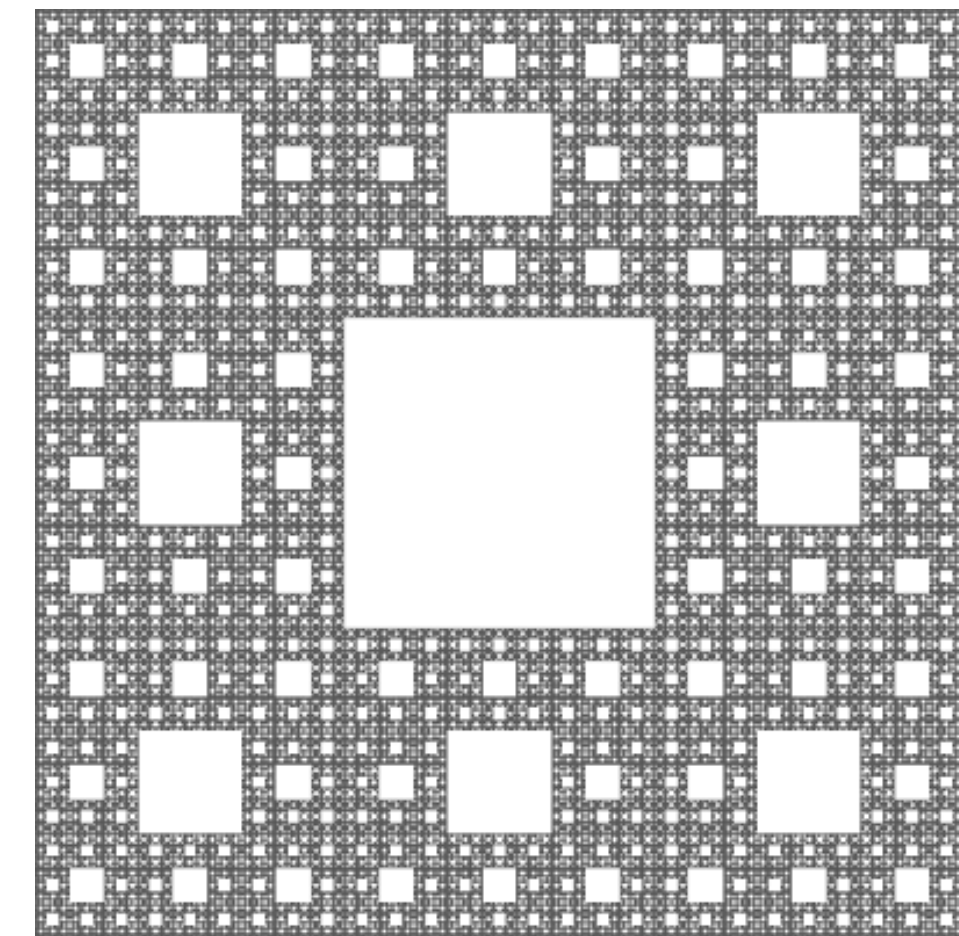
List of basic fractals we have successfully studied by Tensor Networks



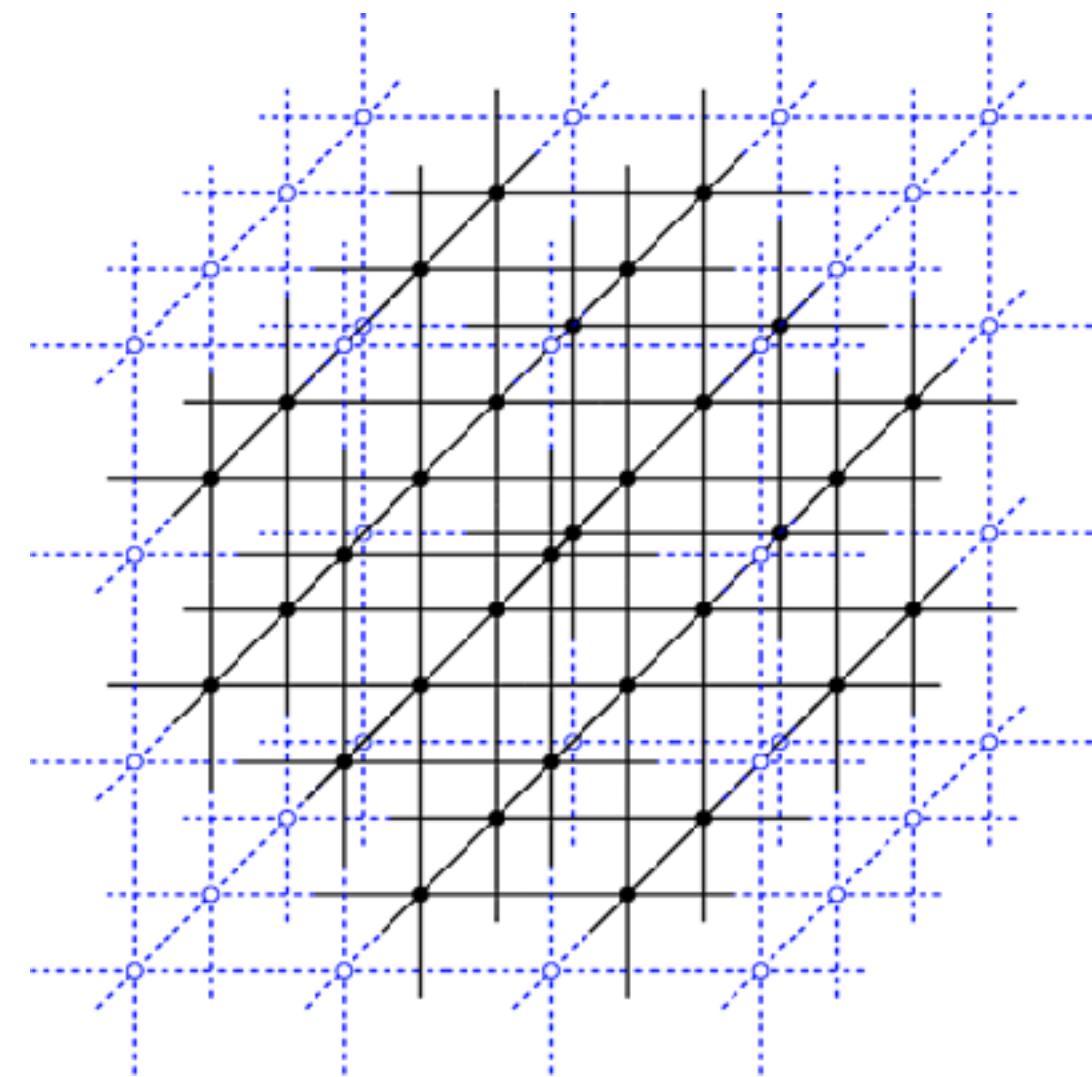
$$d_H = \log_2 3 \approx 1.585$$



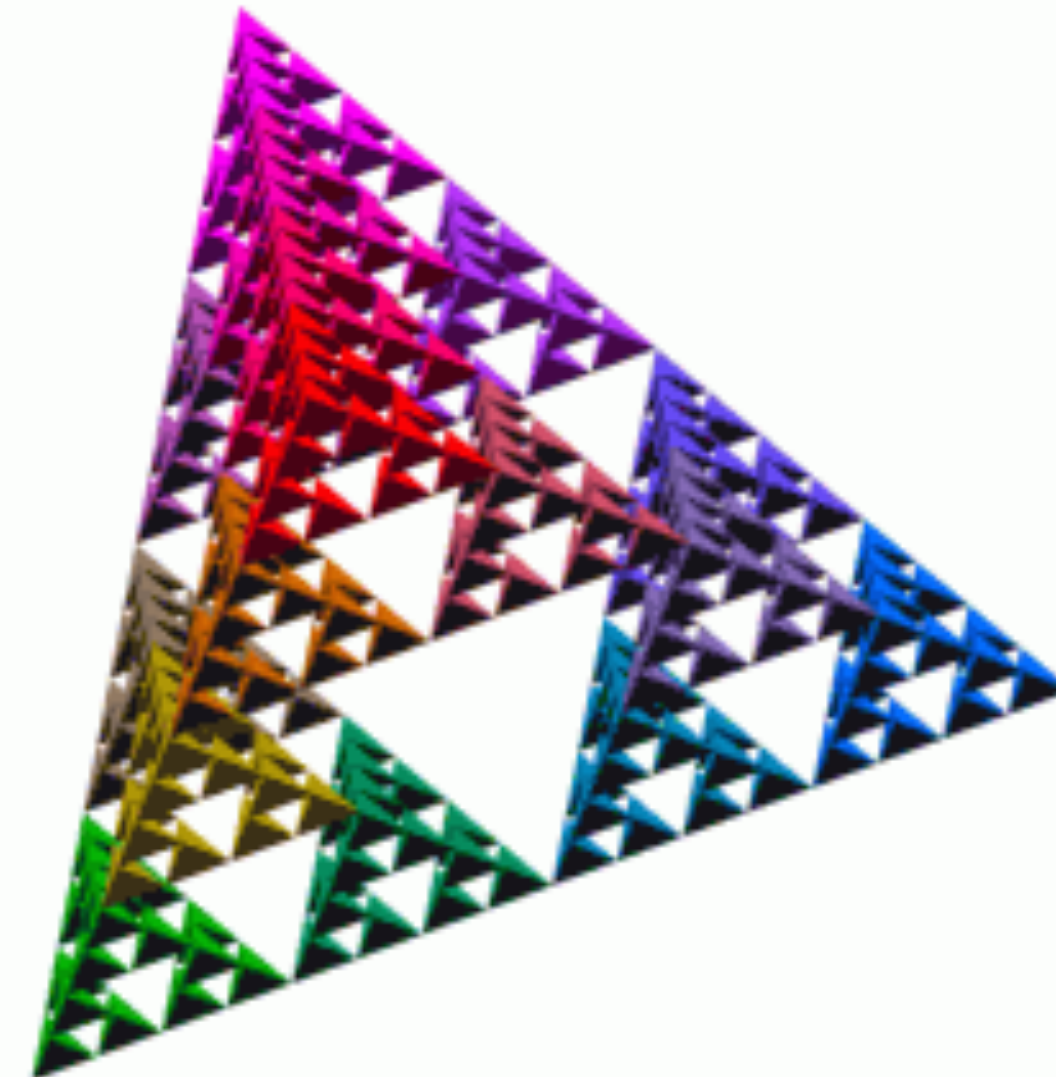
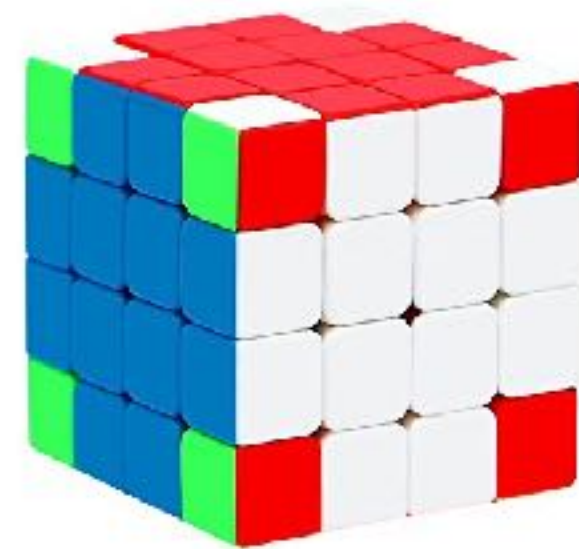
$$d_H = \log_4 12 \approx 1.792$$



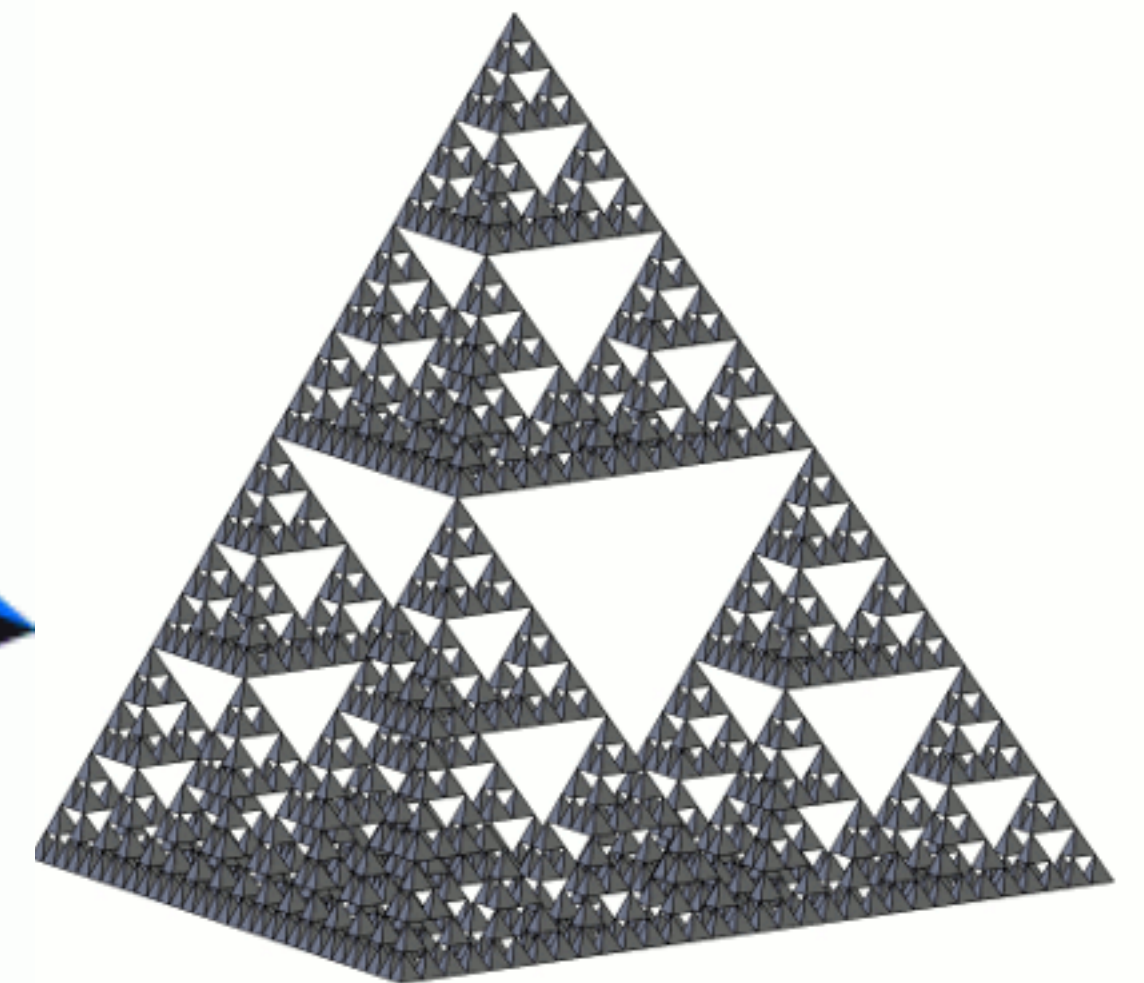
$$d_H = \log_3 8 \approx 1.893$$



$$d_H = \log_4 32 = 2.5$$

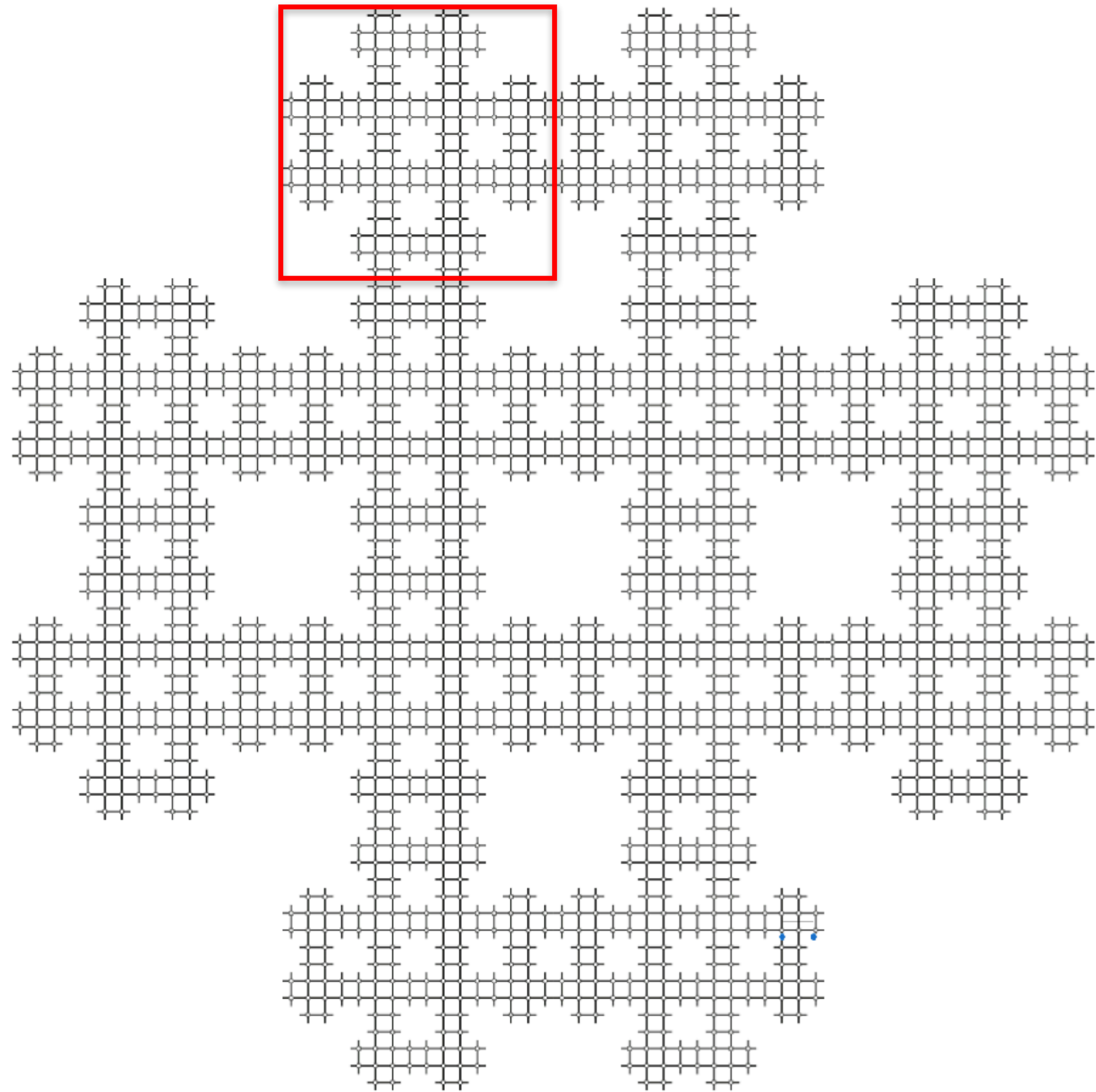
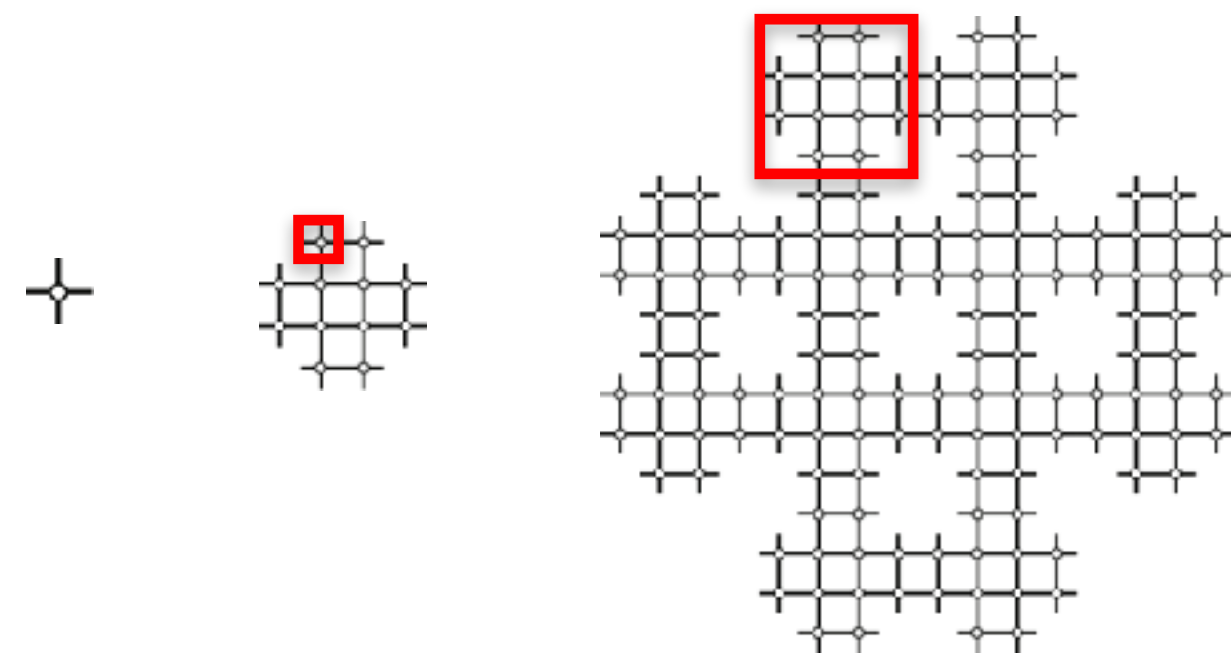


$$d_H = \log_2 4 = 2 (!)$$



Classical Ising model

by HOTRG



Fractal dimension

$$d_H = \frac{\ln 12}{\ln 4} \approx 1.792$$

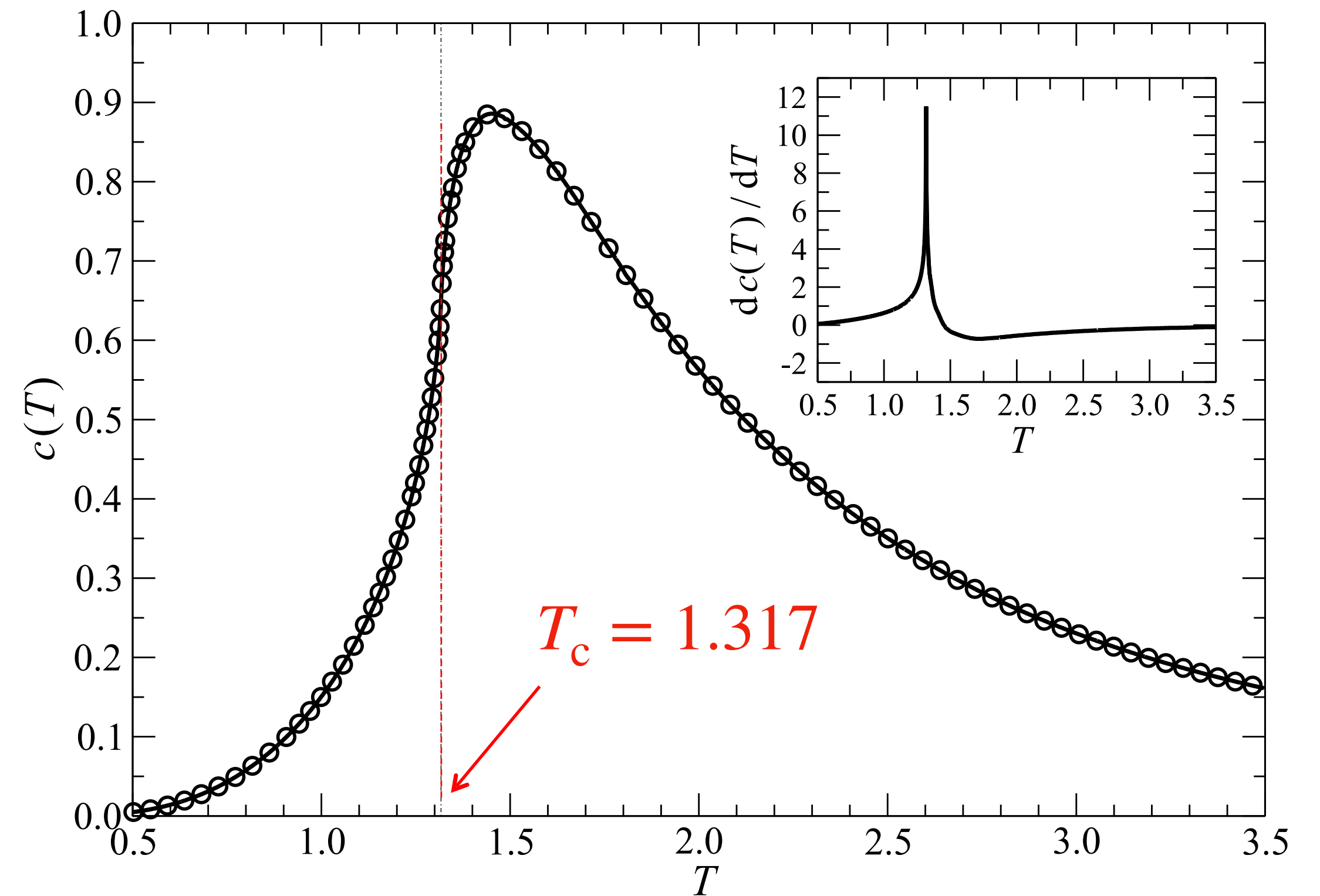
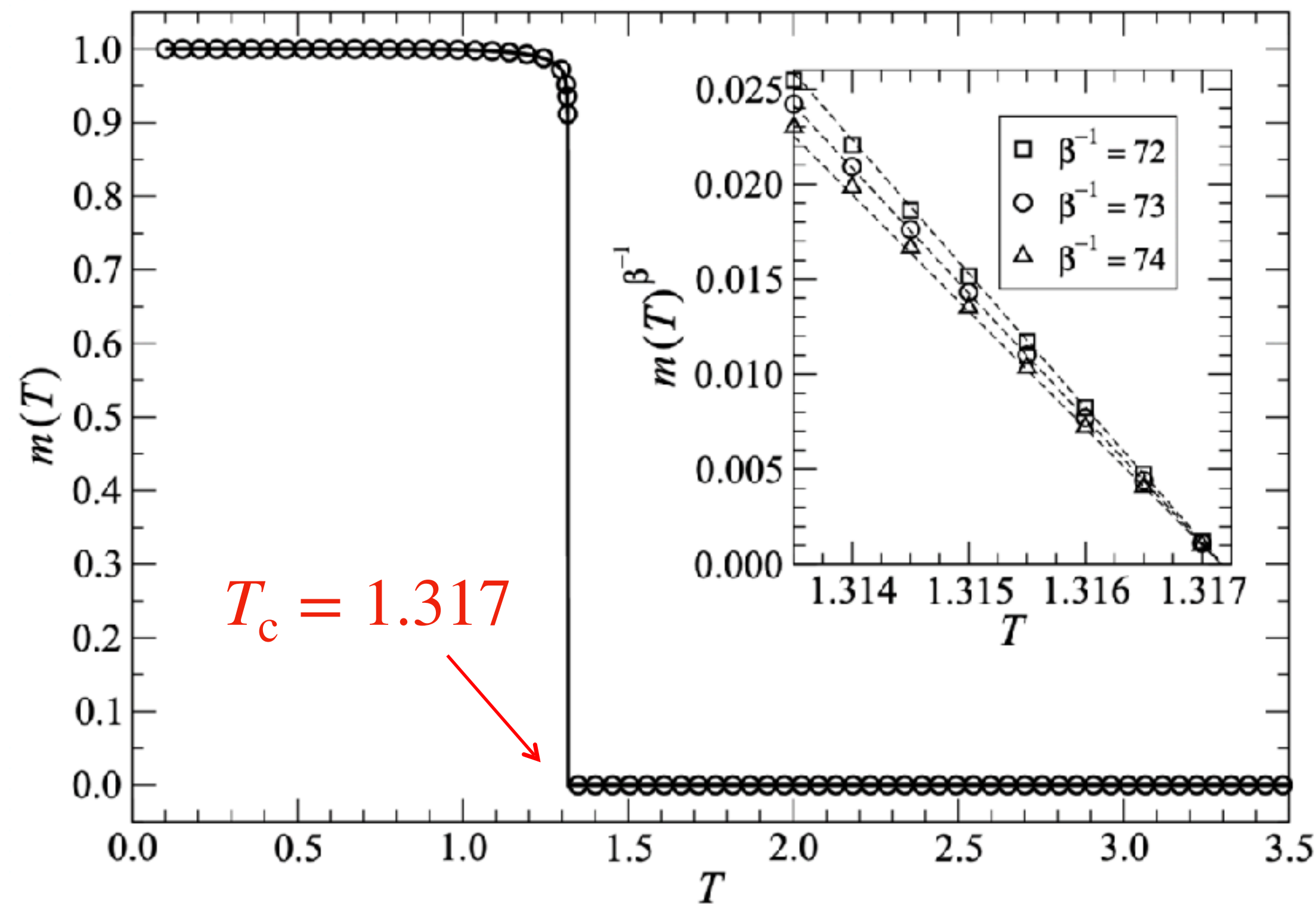
A weak 2nd order phase transition is detected in the classical Ising model

$$T_c = 1.317$$

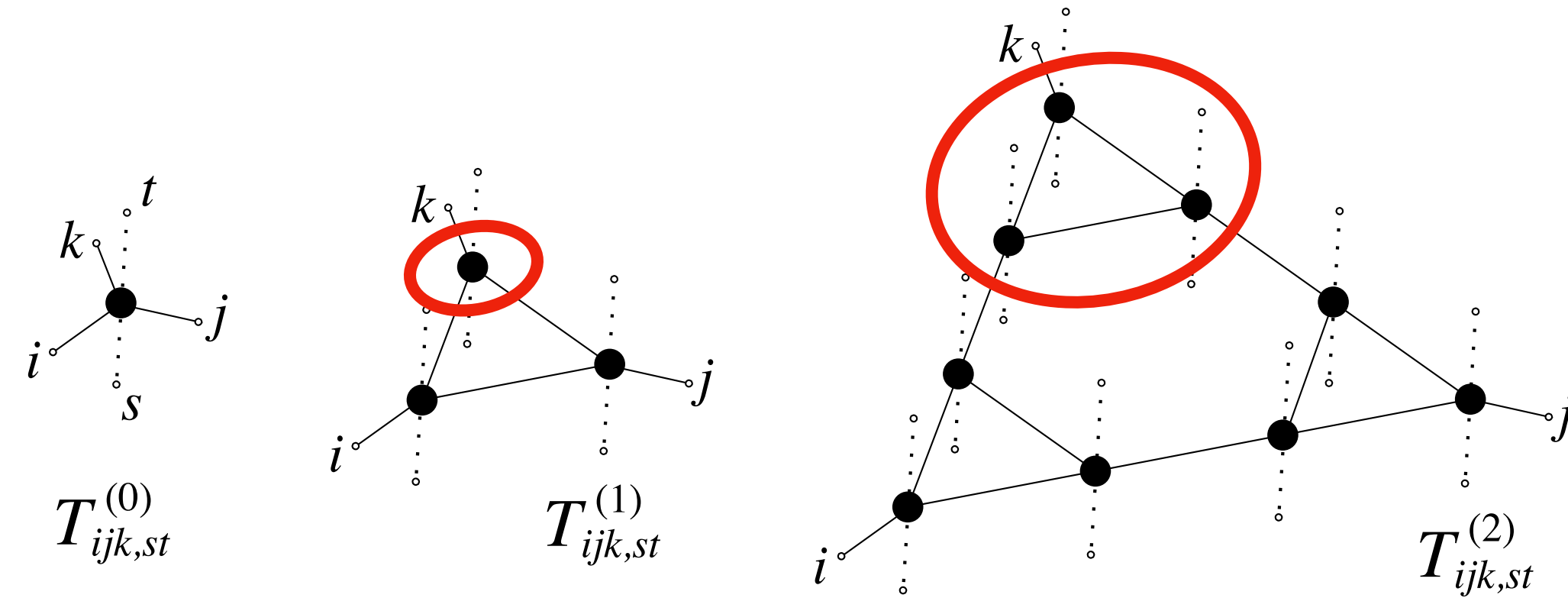
$$\beta = 0.0137$$

$$c(T) = -T \frac{d^2 F}{dT^2}$$

Non-diverging
specific heat?!
(logarithmic corrections)

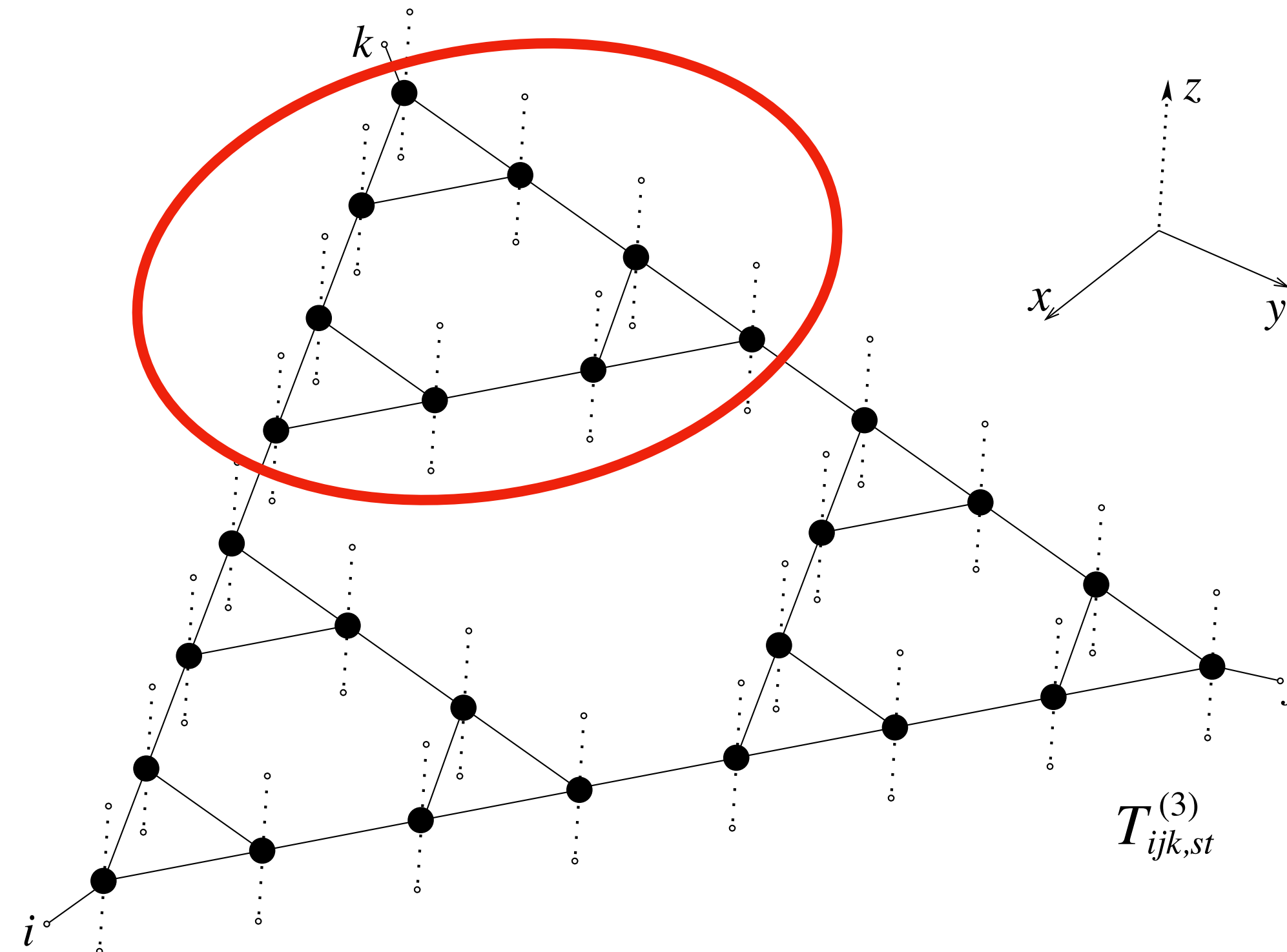


Quantum Ising model by HOTRG

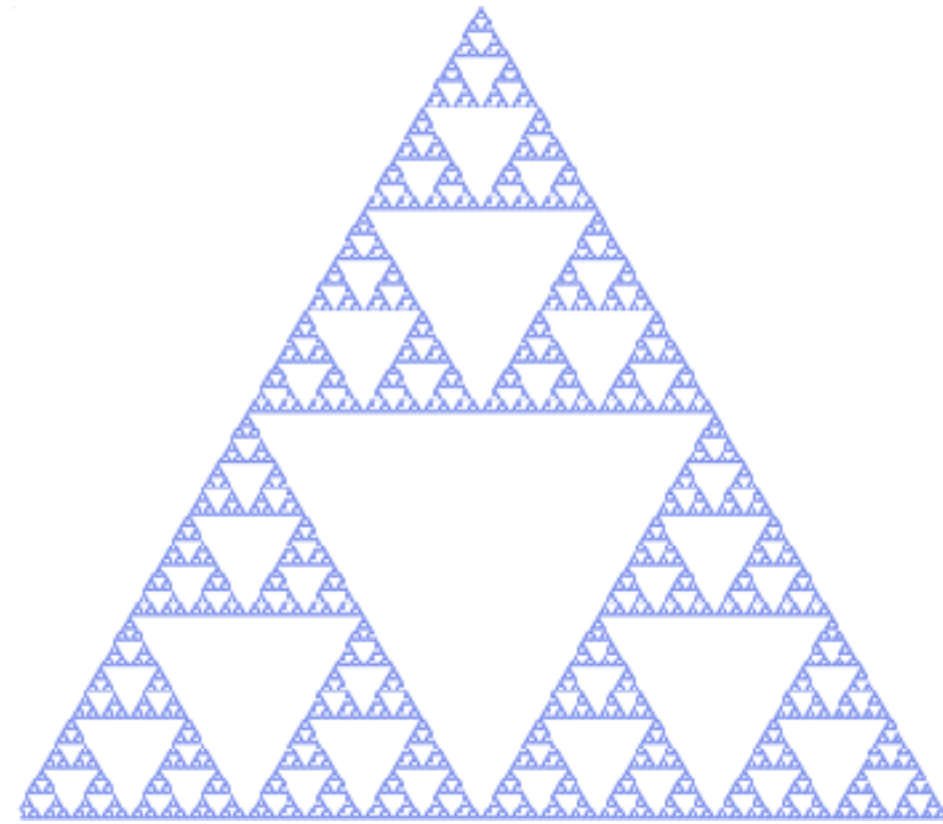


Fractal dimension

$$d_H = \frac{\ln 3}{\ln 2} \approx 1.585$$

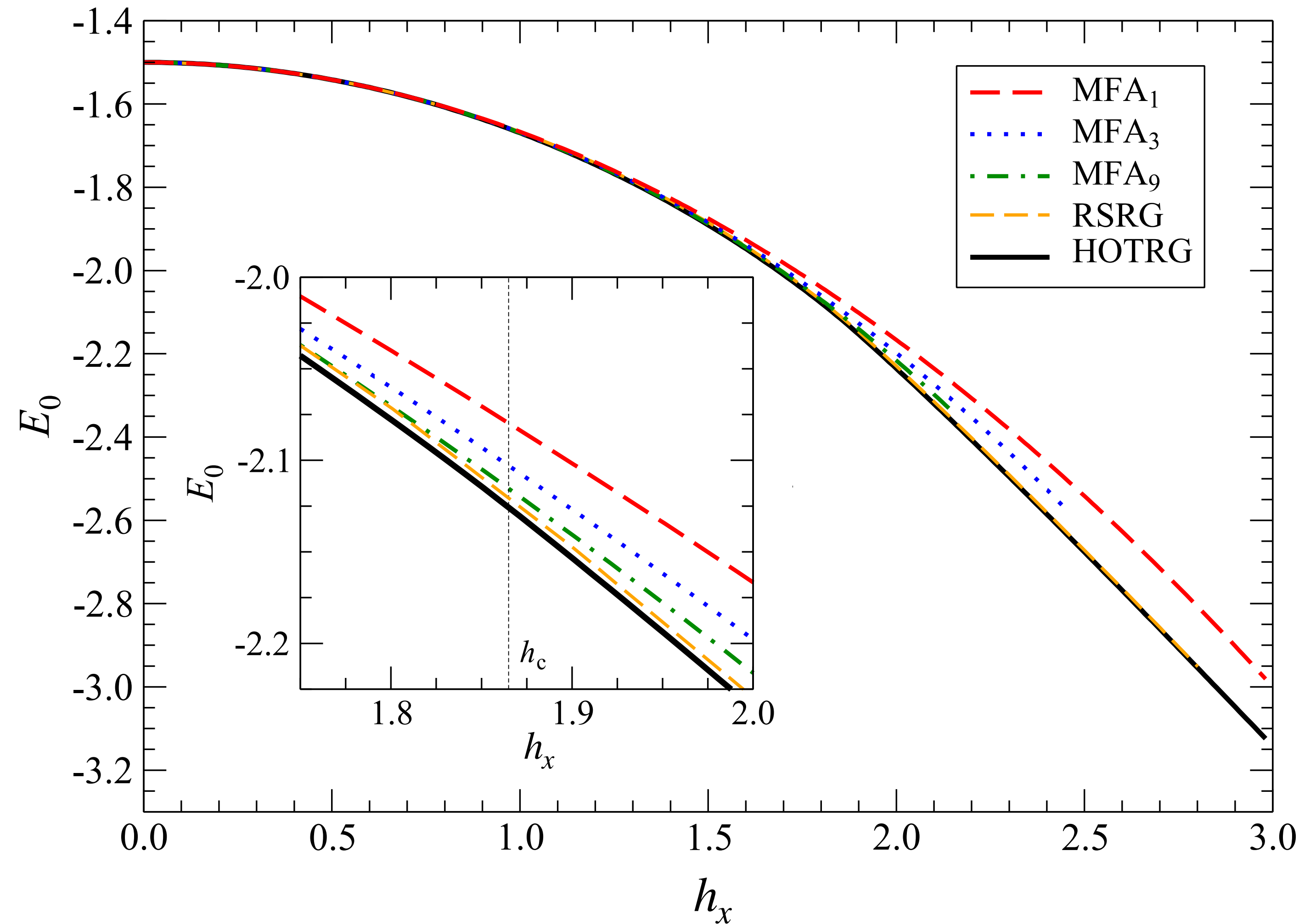


Ground-state energy E_0 of the **quantum Ising model** on Sierpiński triangle

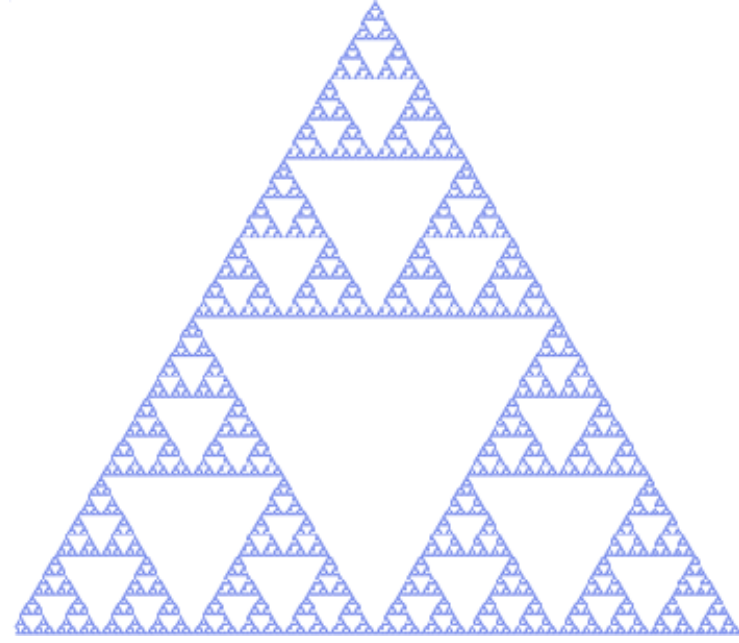


$$\mathcal{H}|\Psi_0\rangle = E_0|\Psi_0\rangle$$

$$\mathcal{H} = -J \sum_{\{i,j\}} \sigma_i^z \sigma_j^z - h_x \sum_i \sigma_i^x$$



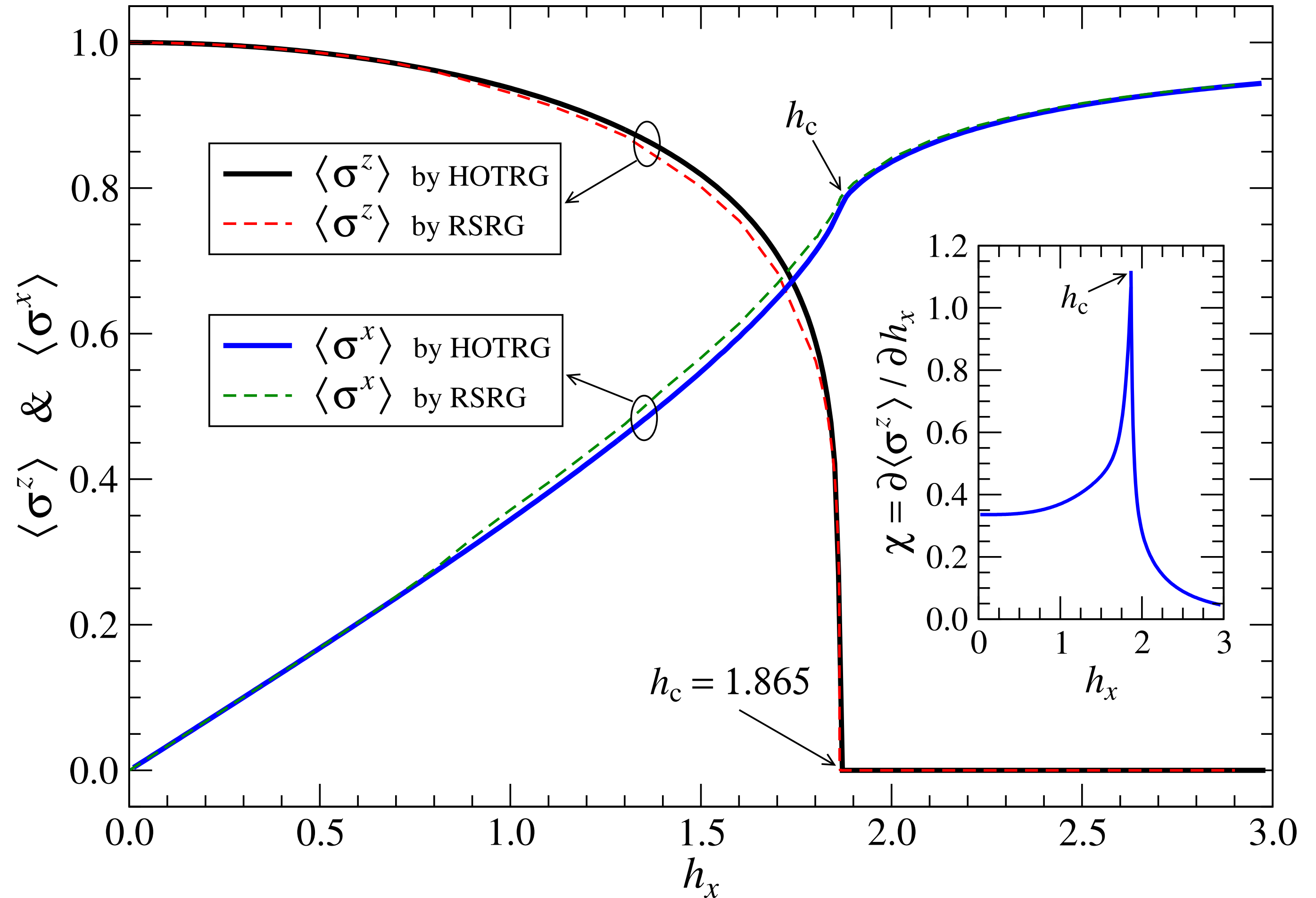
Magnetization $\langle \sigma^z \rangle$ and $\langle \sigma^x \rangle$ on Sierpiński triangle



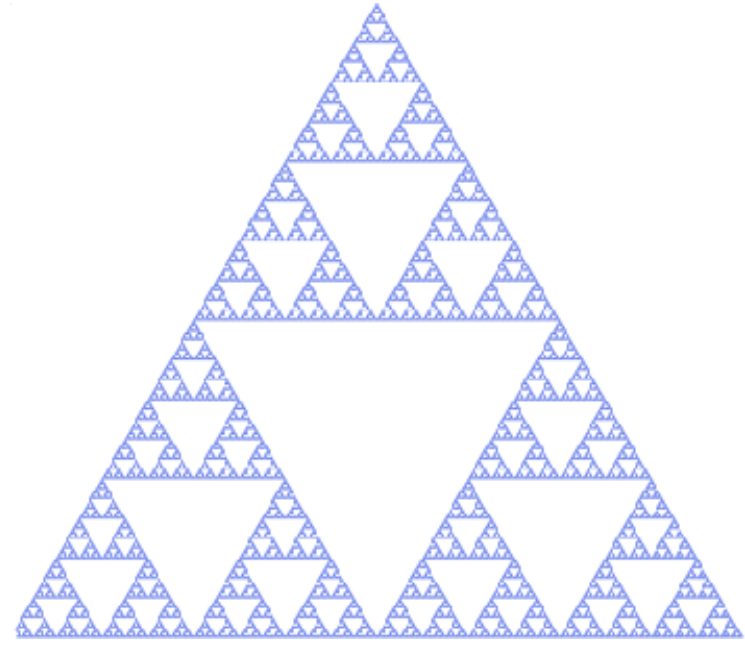
$$\mathcal{H} = -J \sum_{\{i,j\}} \sigma_i^z \sigma_j^z - h_x \sum_i \sigma_i^x$$

$$\langle \sigma^z \rangle = \langle \psi_0 | \sigma_z | \psi_0 \rangle$$

$$\langle \sigma^x \rangle = - \frac{dE_0}{dh_x}$$



Critical exponent β and δ on Sierpiński triangle



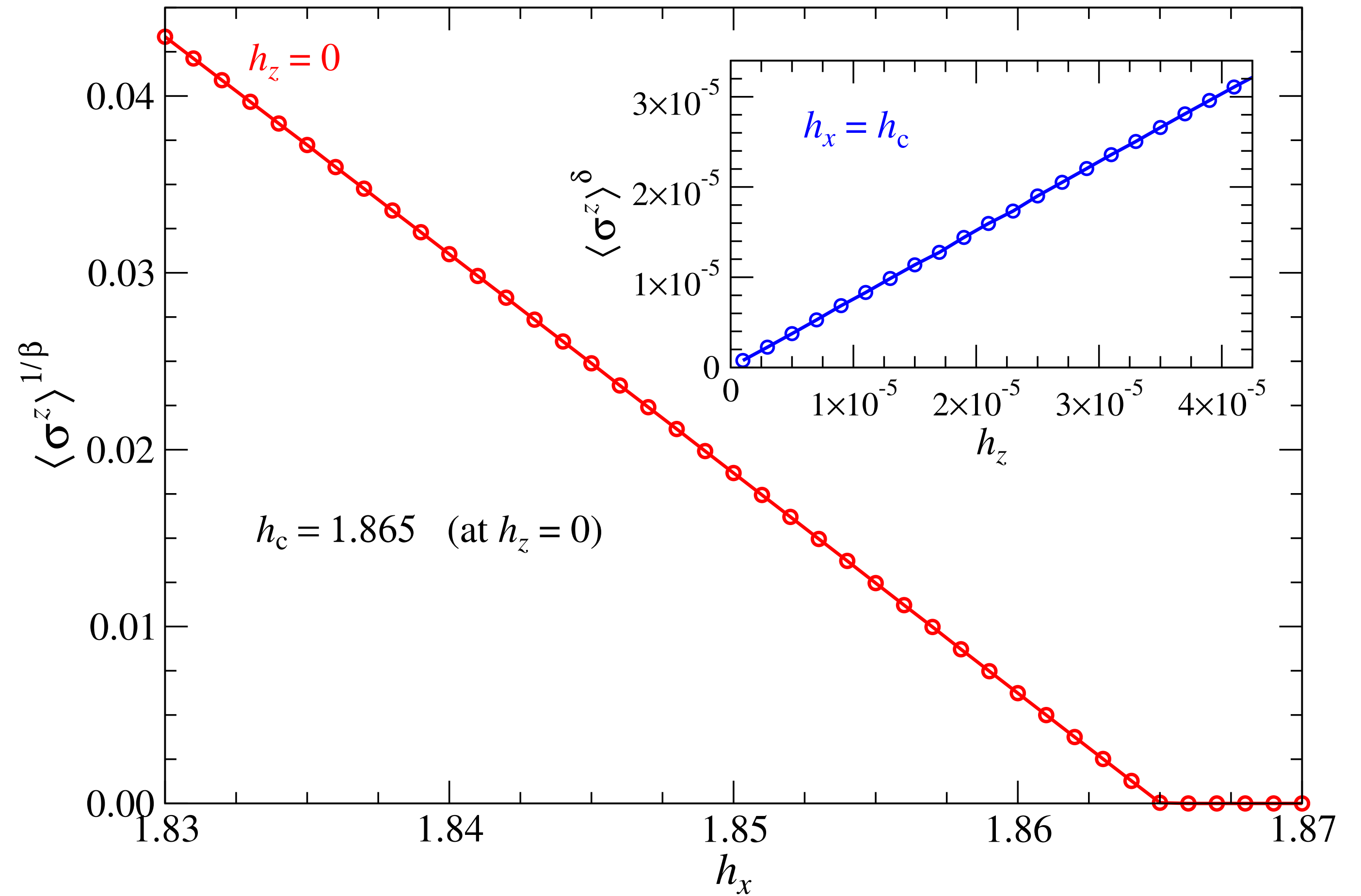
$$\mathcal{H} = -J \sum_{\{i,j\}} \sigma_i^z \sigma_j^z - h_x \sum_i \sigma_i^x - h_z \sum_i \sigma_i^z$$

$$\langle \sigma^z \rangle \propto (h_c - h_x)^\beta$$

$$\langle \sigma^x \rangle \propto h_z^{1/\delta} \quad \text{at } h_x = h_c$$

$$\beta \approx 1/5$$

$$\delta \approx 8.7$$



Summary: Transverse-field Ising model on the Sierpiński triangle

$$\mathcal{H} = -J \sum_{\langle a,b \rangle} S_a^z S_b^z - h \sum_a S_a^x$$

We applied **three** independent methods.

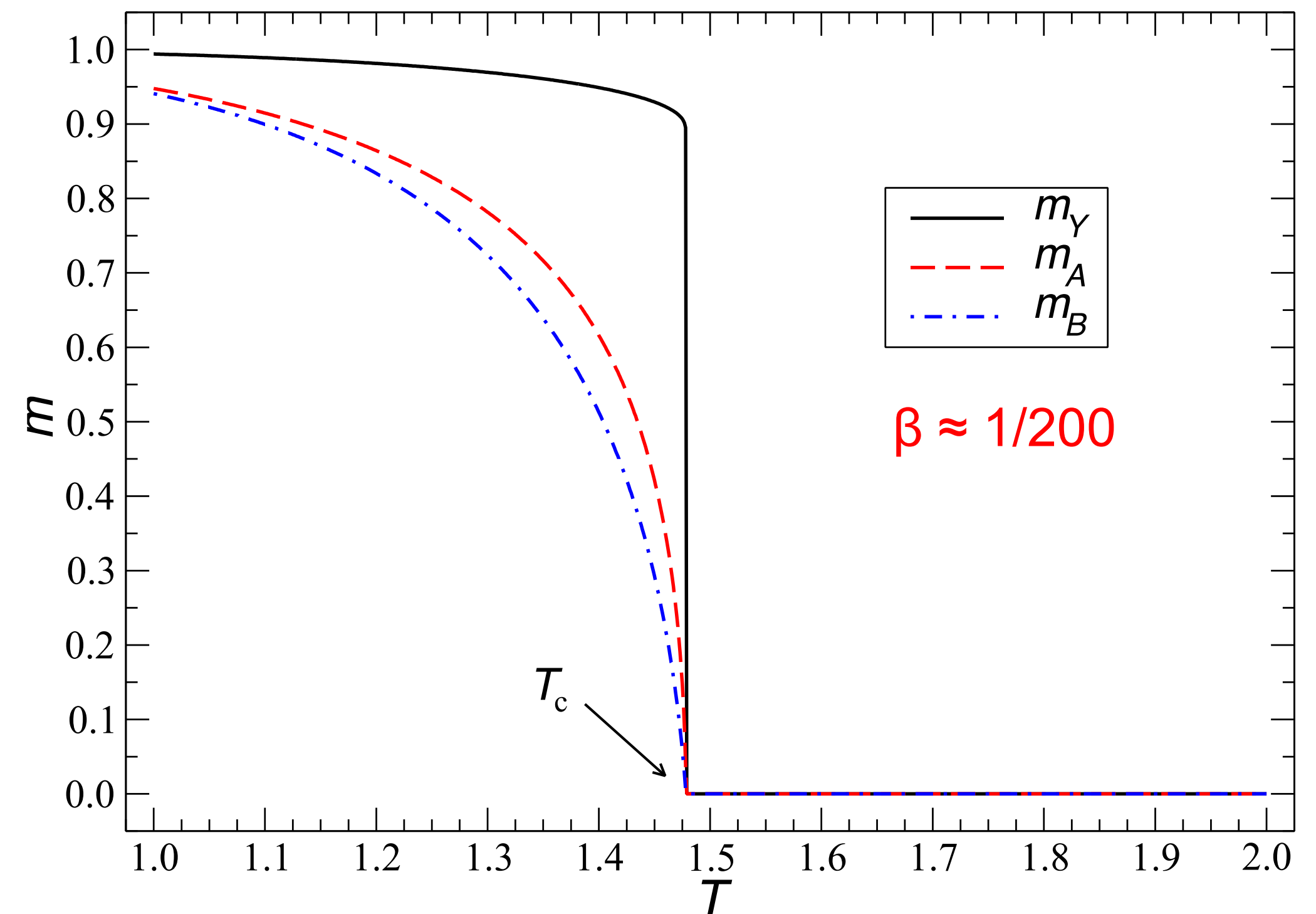
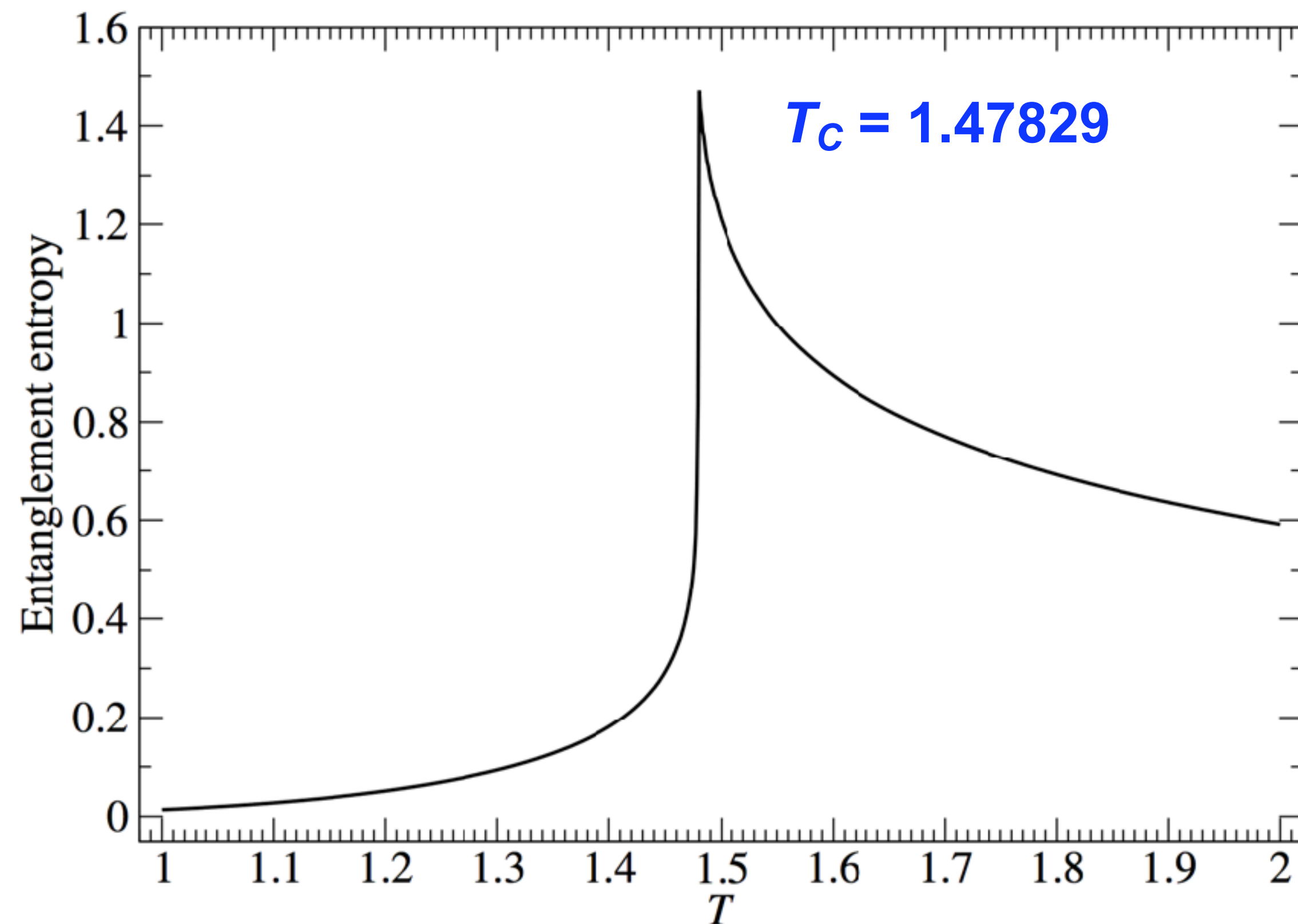
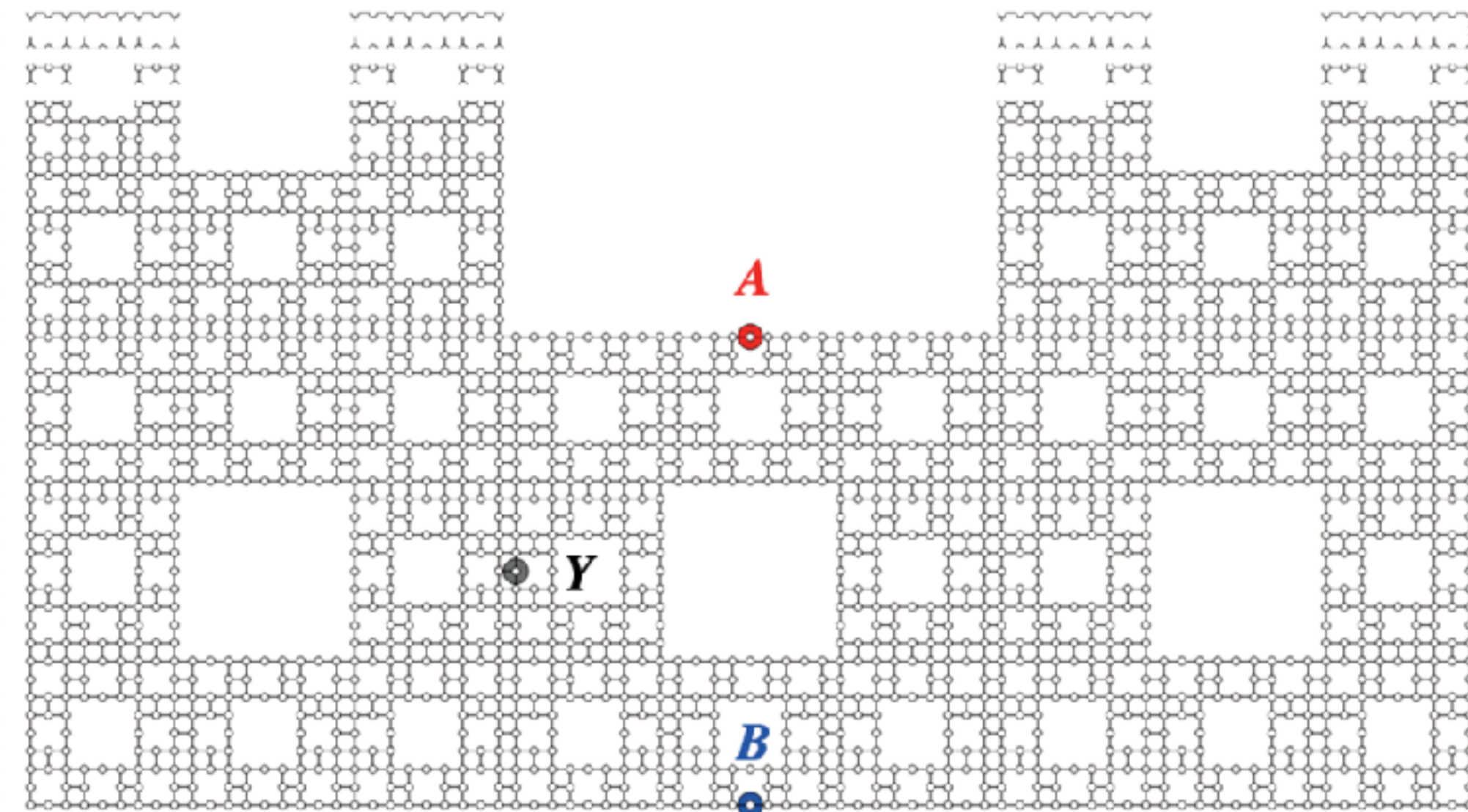
1. The improved Mean-Field Approximations (**MFA_n**):
 $h_c = 3.00$ (MFA₁)
 $h_c = 2.46$ (MFA₃)
 $h_c = 2.17$ (MFA₉)
2. Real-Space Renormalization Group (**RSRG**):
 $h_c = 1.864$
3. Higher-Order Tensor Renormalization Group (**HOTRG**): $h_c = \mathbf{1.86497}$

d_H	h_c	β	δ	method used
$\log_2 2 = 1$	1	0.125	15	exact solution
$\log_2 3 \approx 1.585$	1.865	0.20	8.7	HOTRG, MC
$\log_2 4 = 2$	3.0439	0.3295	4.8	HOTRG, CAM

Boundaries in fractals might not be trivial

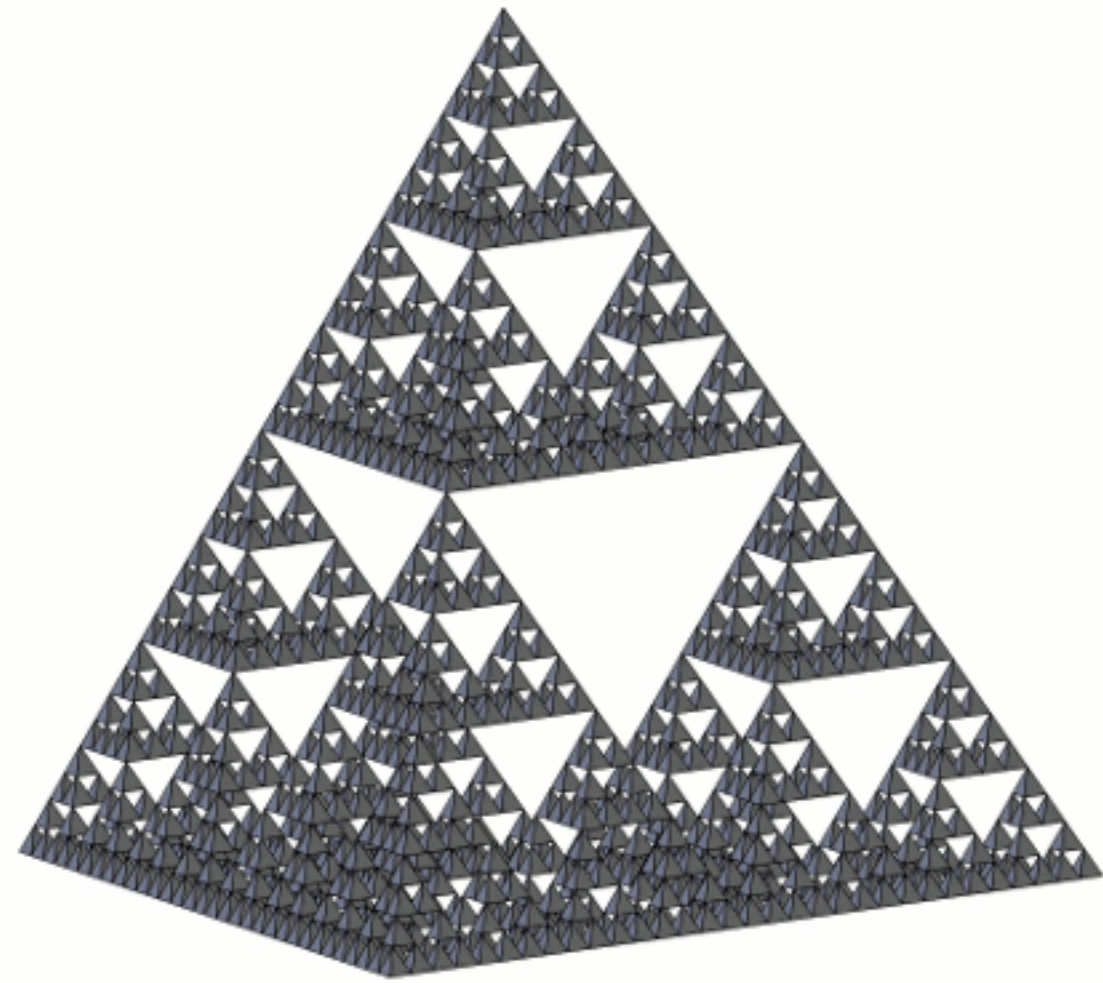
Classical Ising model on Sierpiński carpet

$$d_H = \log_3 8 \approx 1.893$$



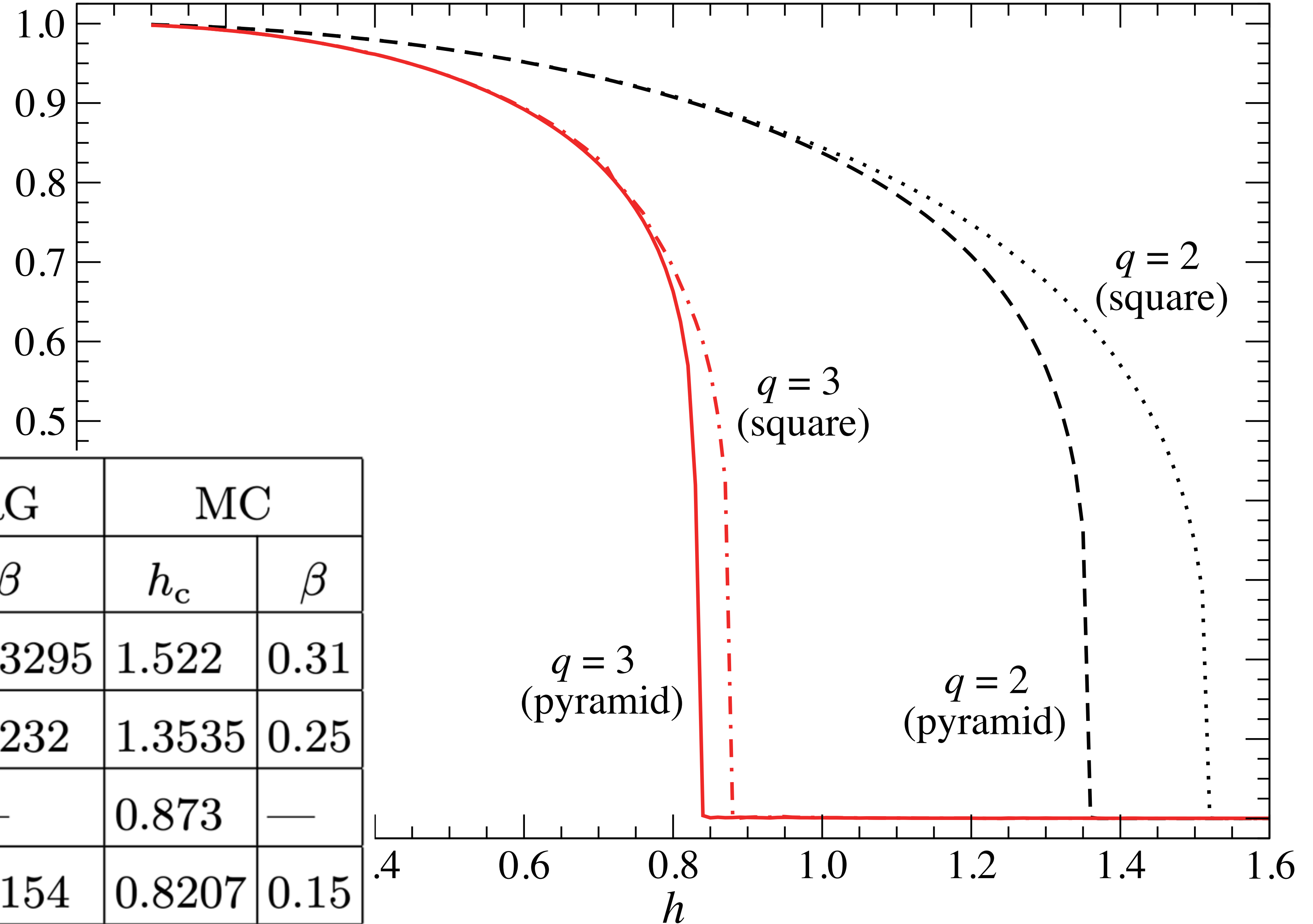
Are scaling relations also valid for non-integer (fractal) dimension?

q -state quantum Potts model



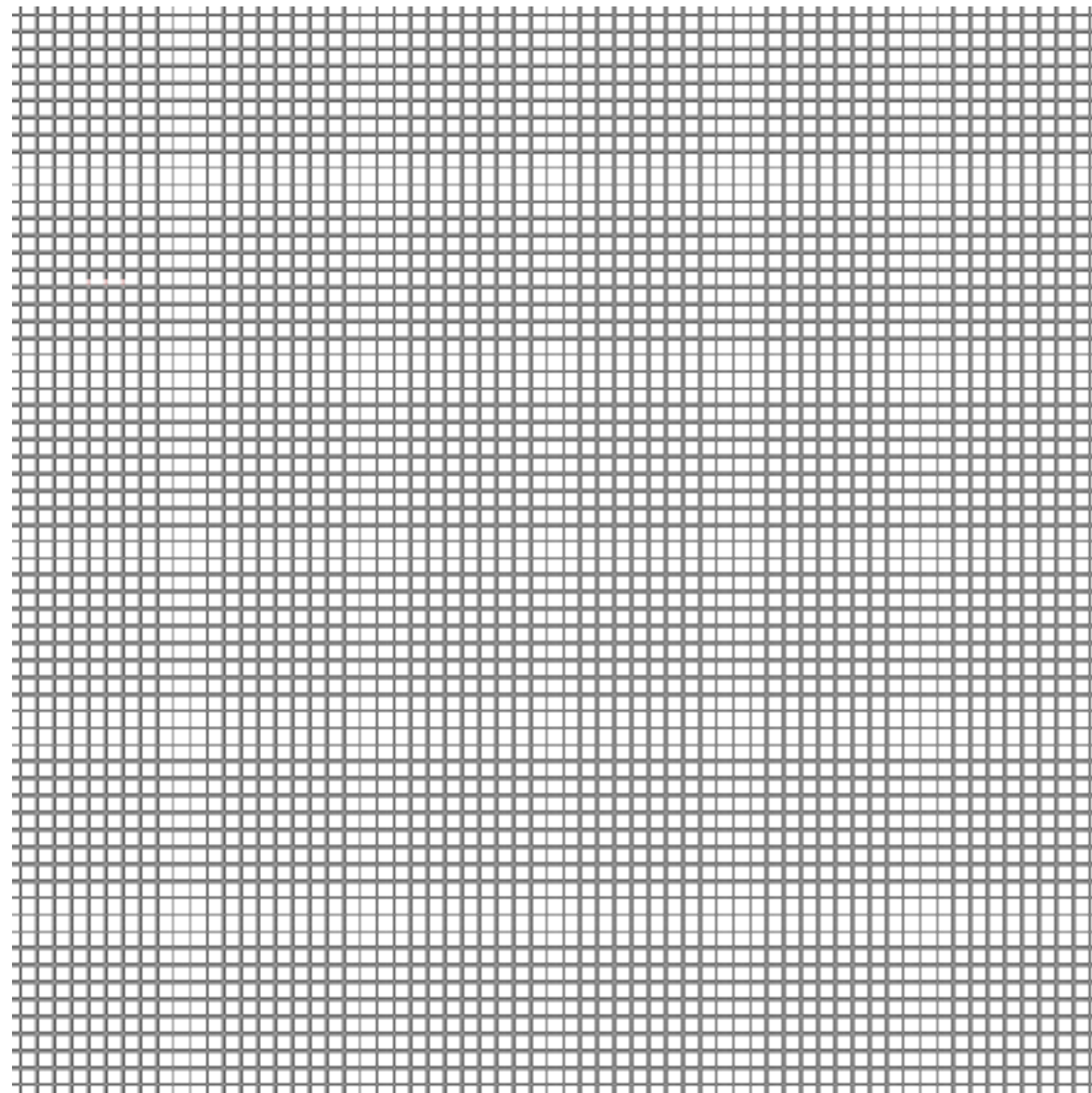
$$d_H = \log_2 4 = 2$$

M



Model (lattice)	HOTRG		MC	
	h_c	β	h_c	β
$q = 2$ (square)	1.5219	0.3295	1.522	0.31
$q = 2$ (pyramid)	1.358	0.232	1.3535	0.25
$q = 3$ (square)	0.876	—	0.873	—
$q = 3$ (pyramid)	0.832	0.154	0.8207	0.15

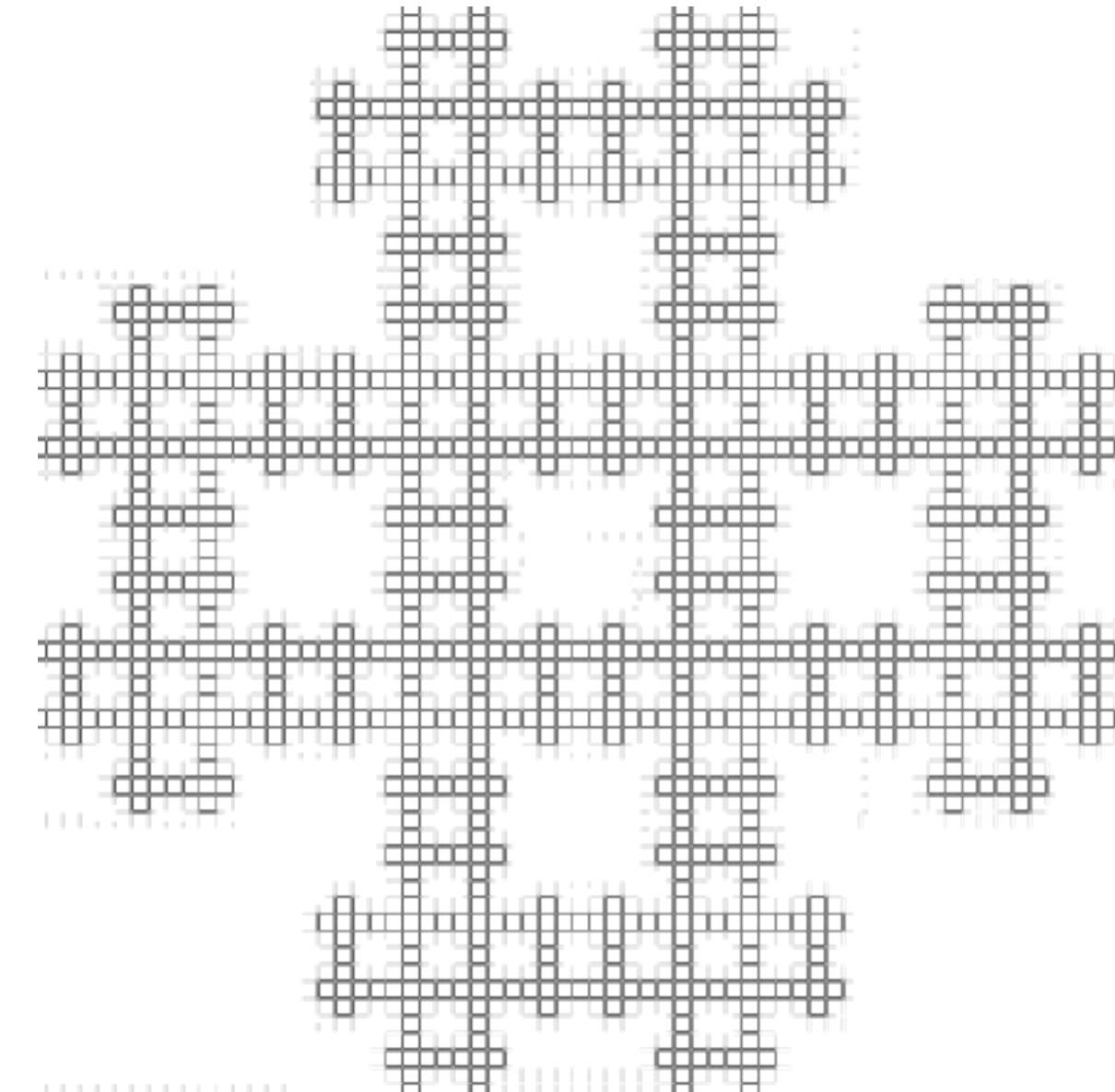
Square lattice



$$d_H = 2$$

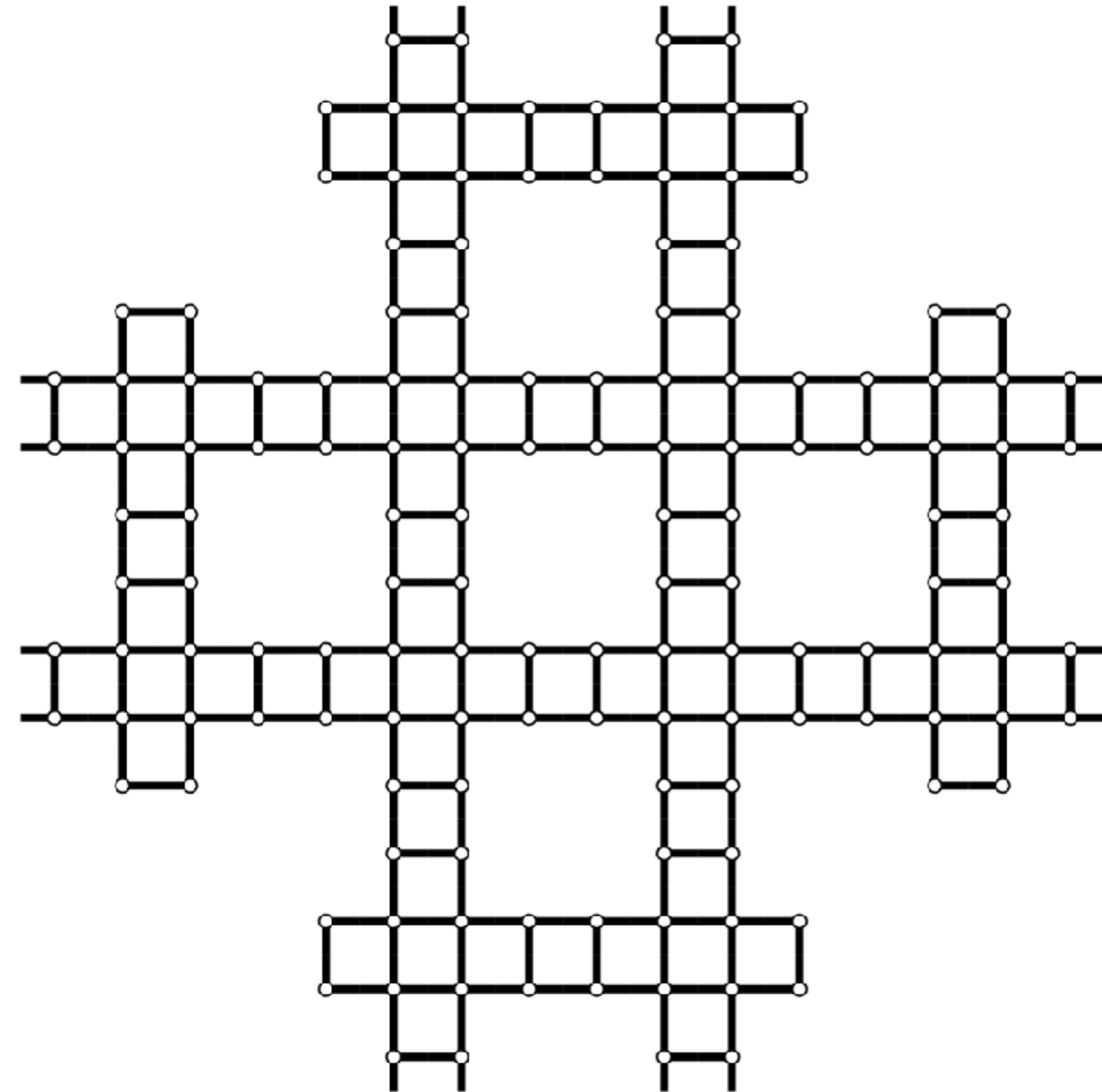
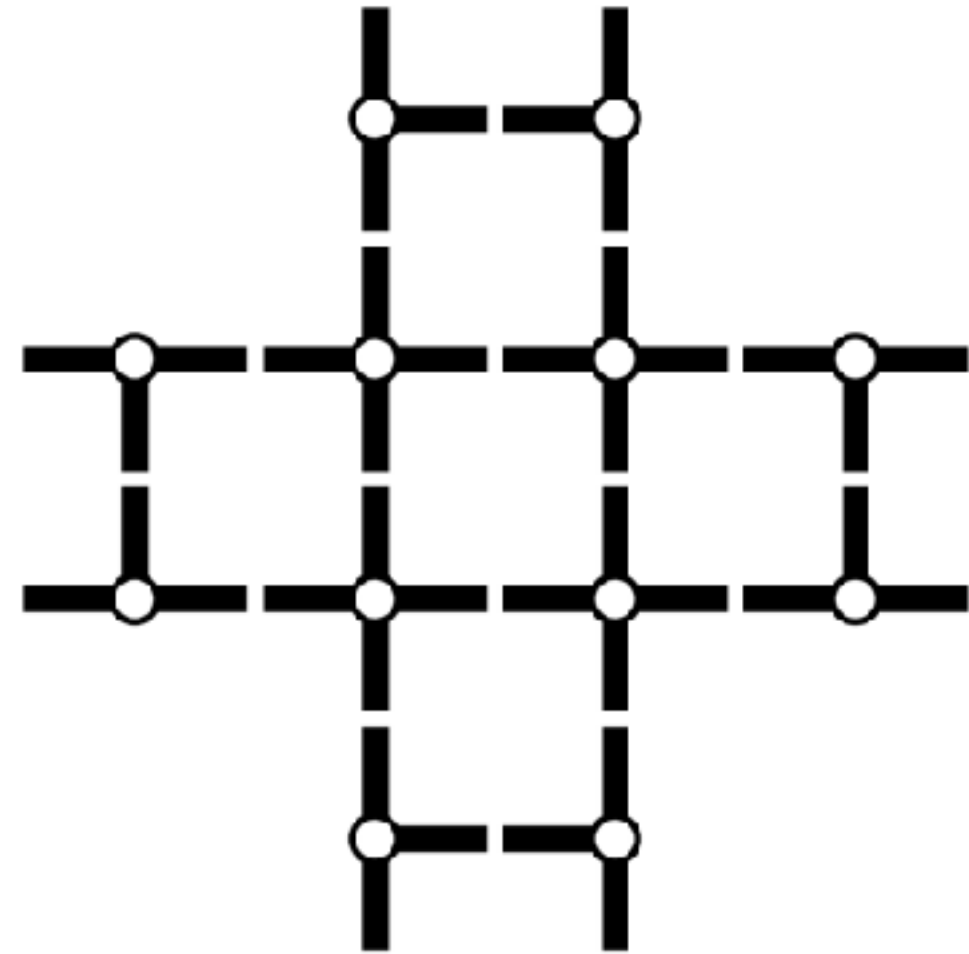
Continuous
transformation?

Fractal lattice



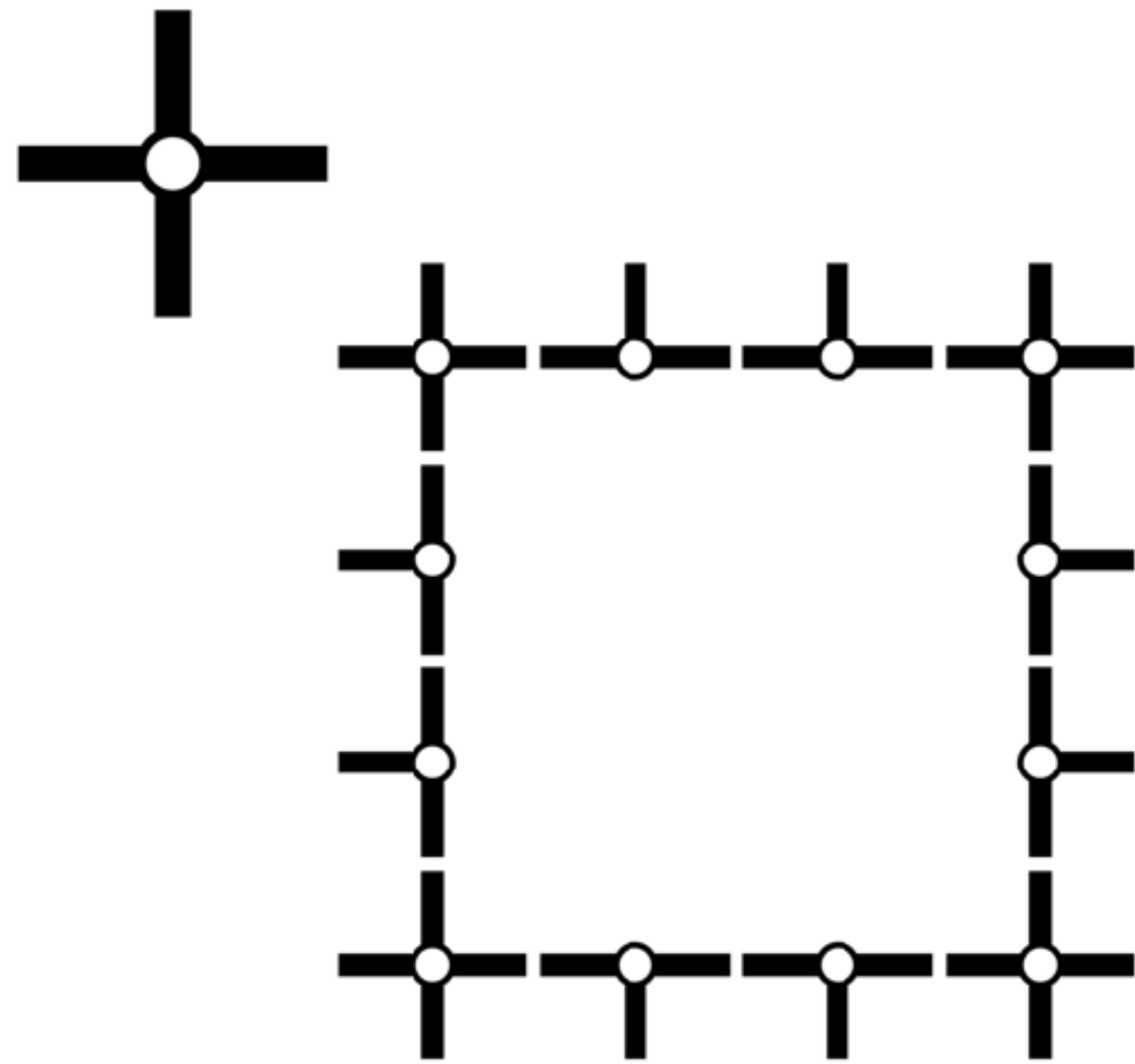
$$d_H \approx 1.792$$

Fractal₁



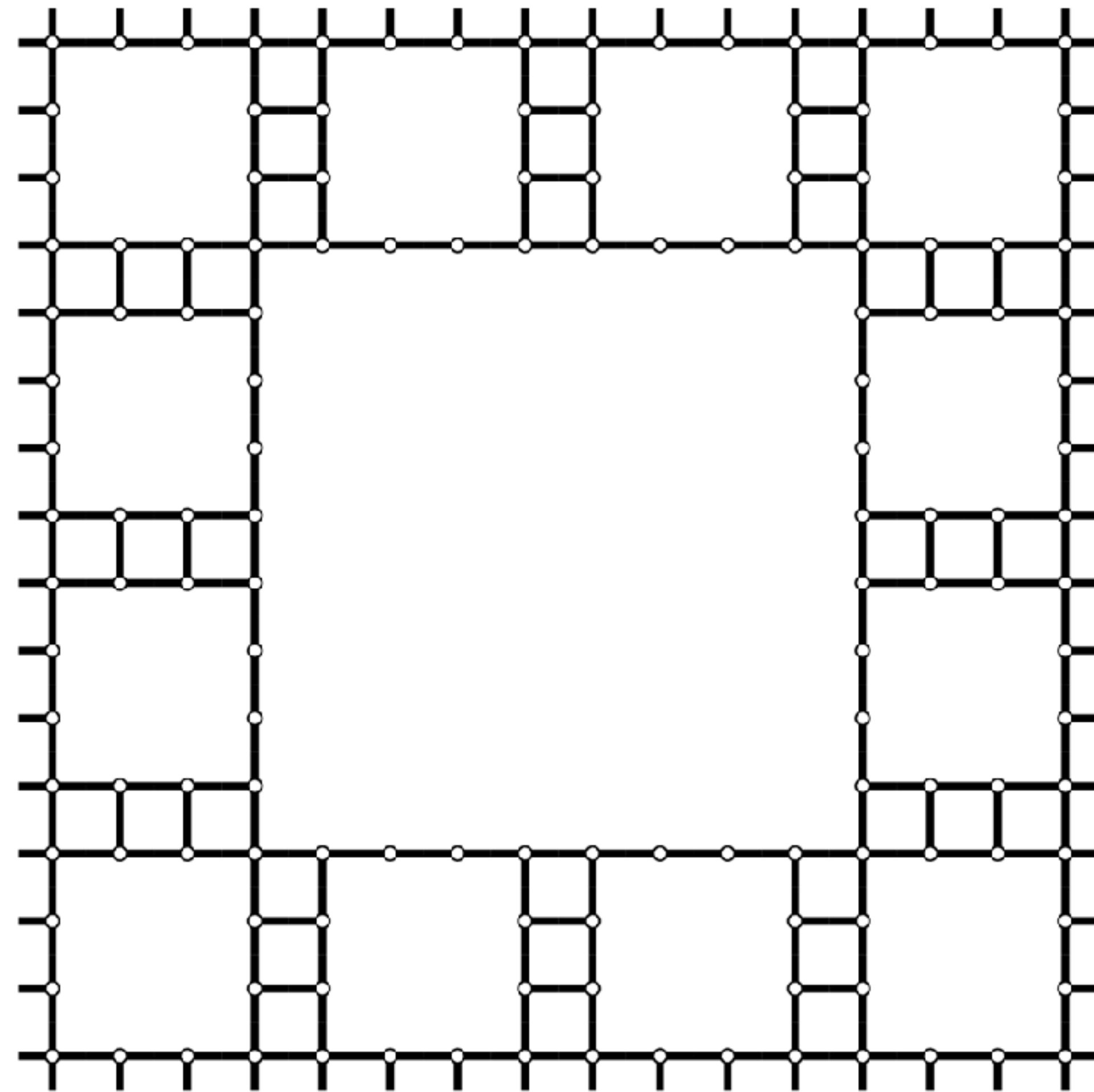
$$d_H = \frac{\ln(12)}{\ln(4)} \approx 1.792$$

Fractal₂

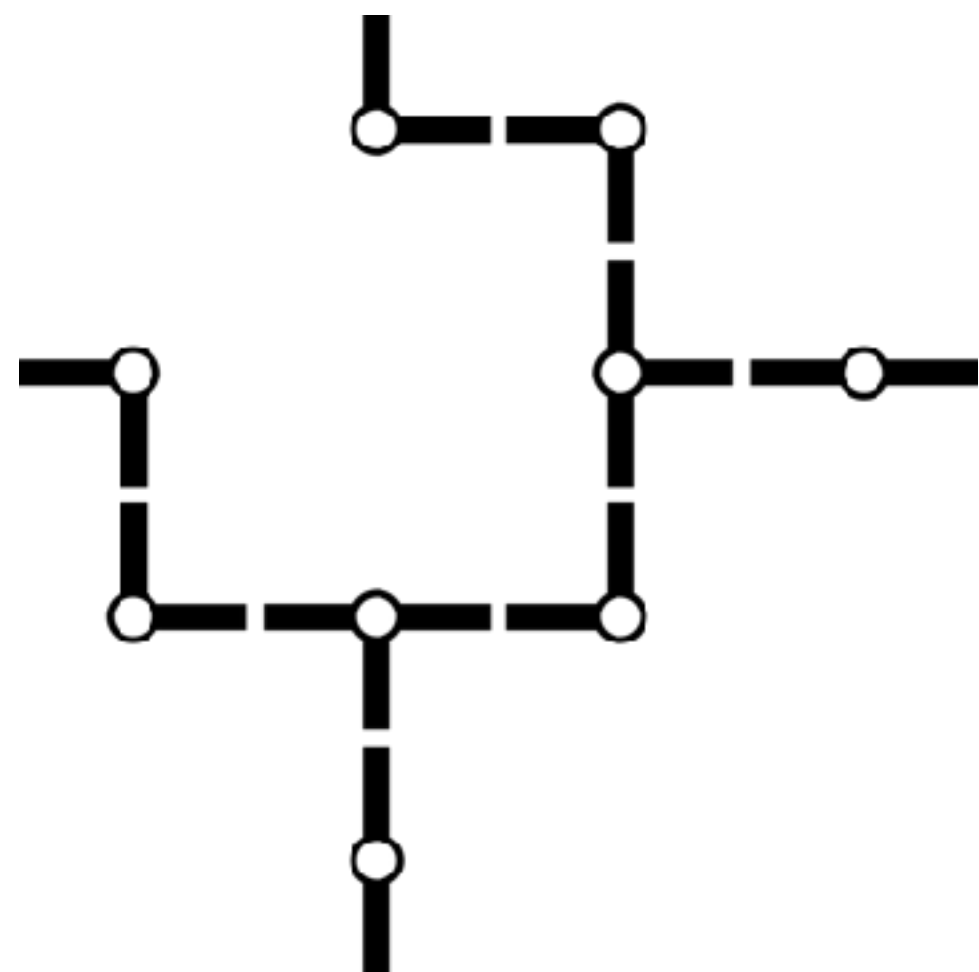
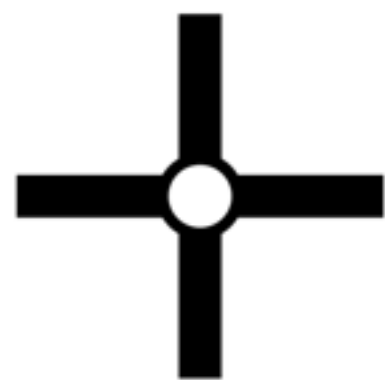


$$d_H = \frac{\ln(12)}{\ln(4)} \approx 1.792$$

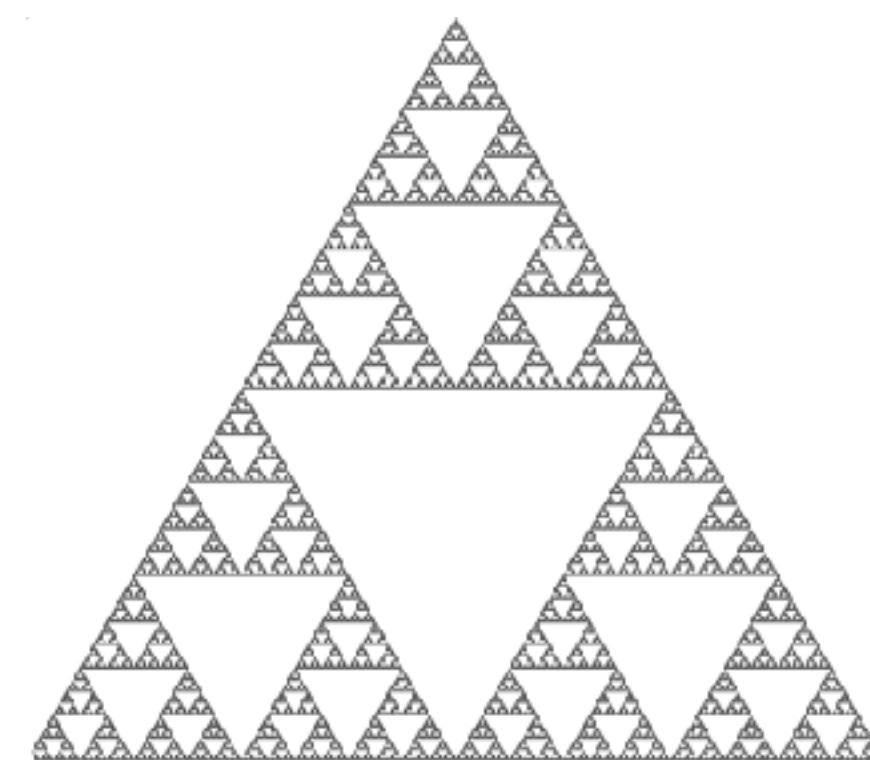
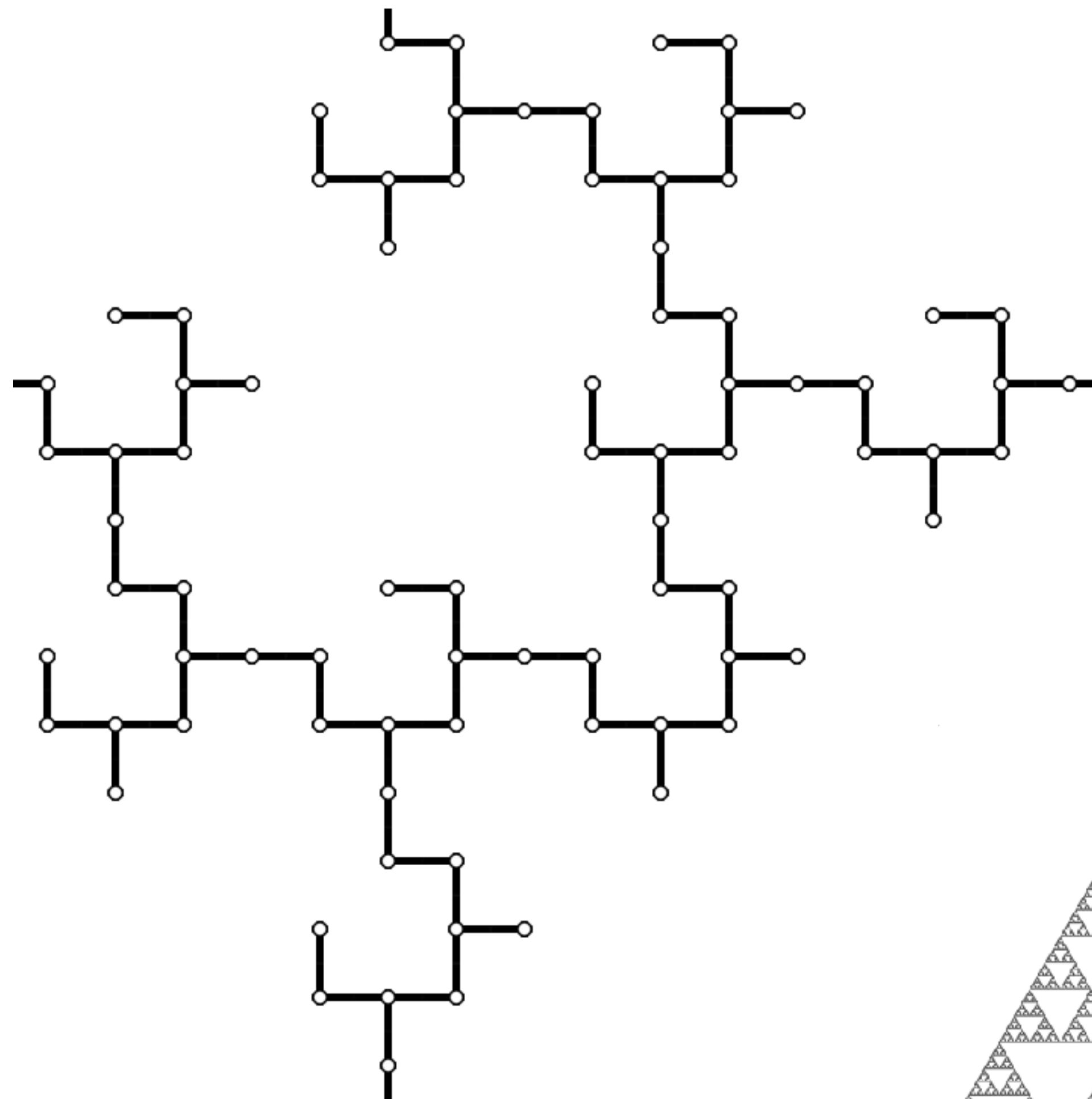
Sierpiński Carpet



Fractal₃



$$d_H = \frac{\ln(9)}{\ln(4)} \approx 1.585$$

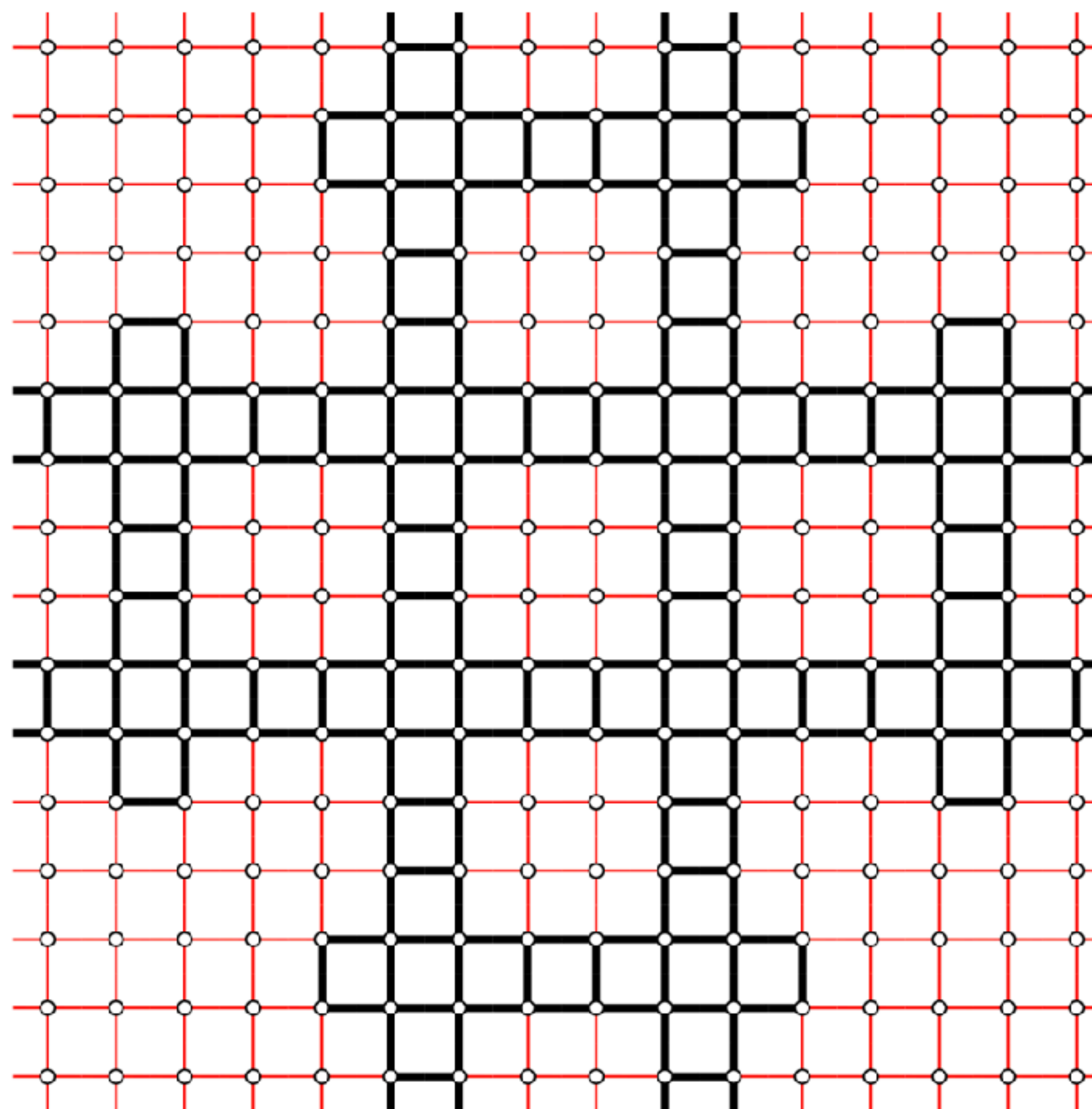
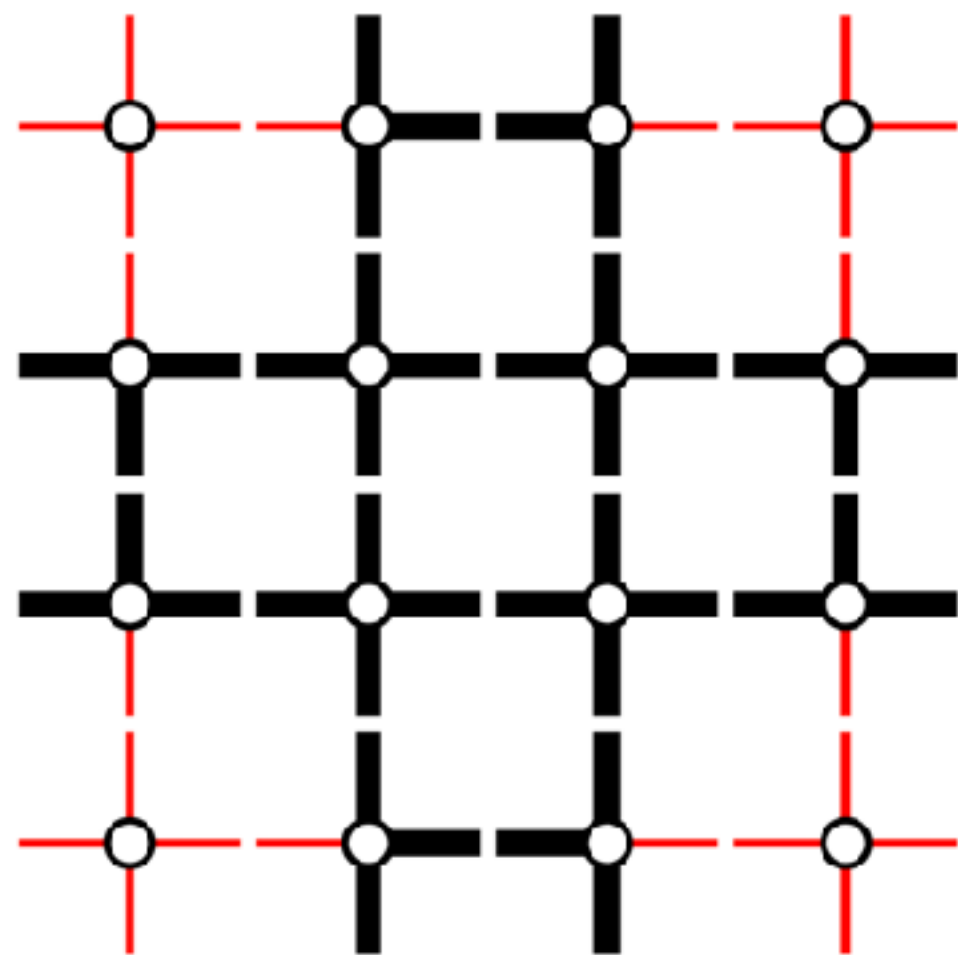
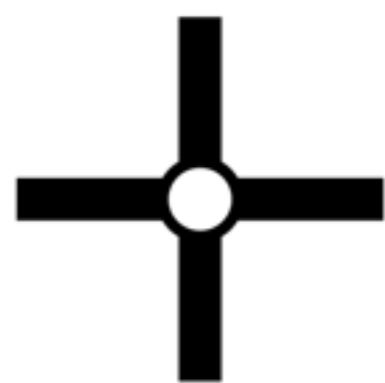


$$d_H = \frac{\ln 3}{\ln 2} \approx 1.585$$

$$\mathcal{H} = -J_1 \sum_{\langle ij \rangle_1} \sigma_i \sigma_j - J_2 \sum_{\langle ij \rangle_2} \sigma_i \sigma_j$$

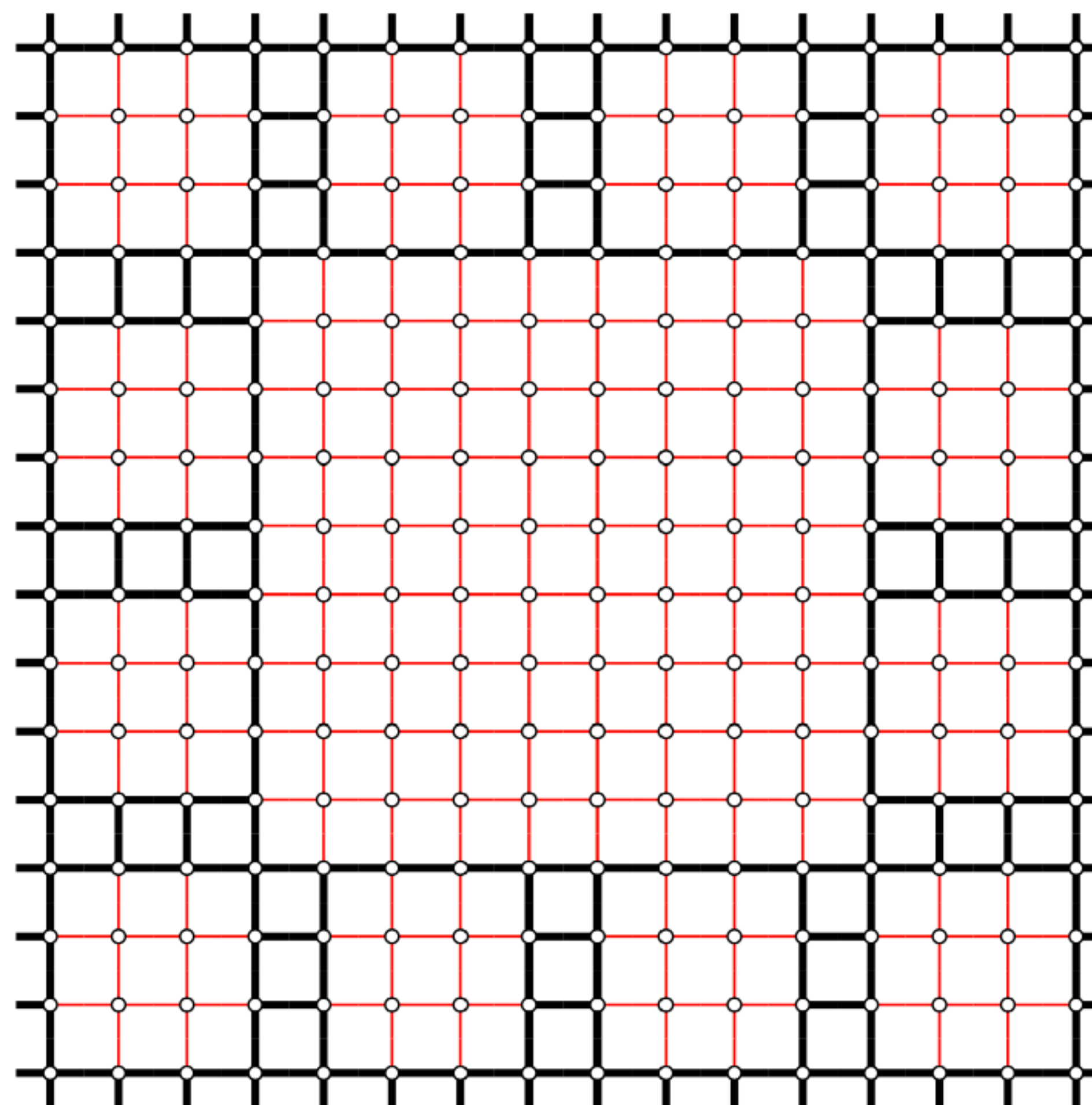
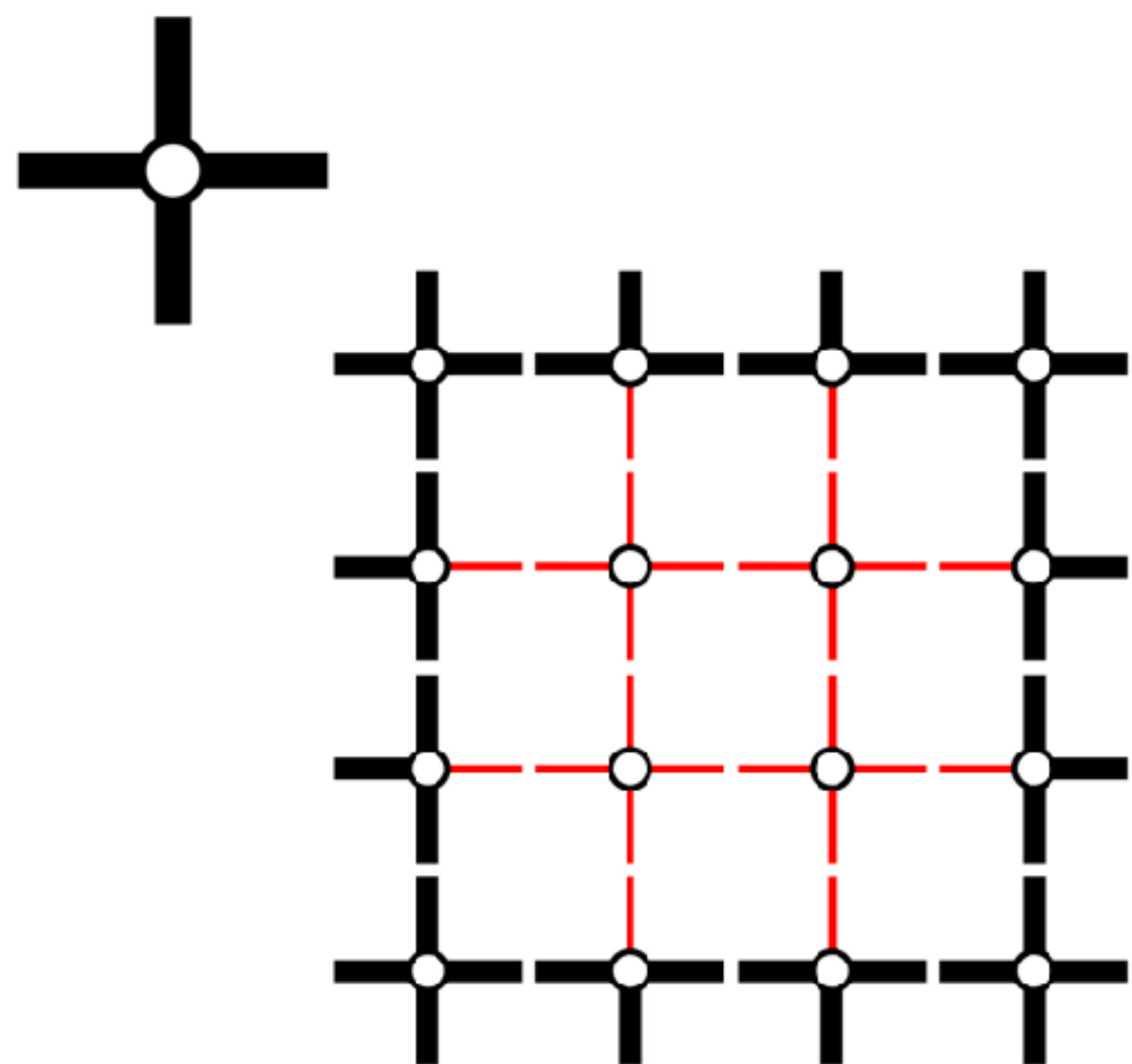
Fractal₁

$J_1 - J_2$



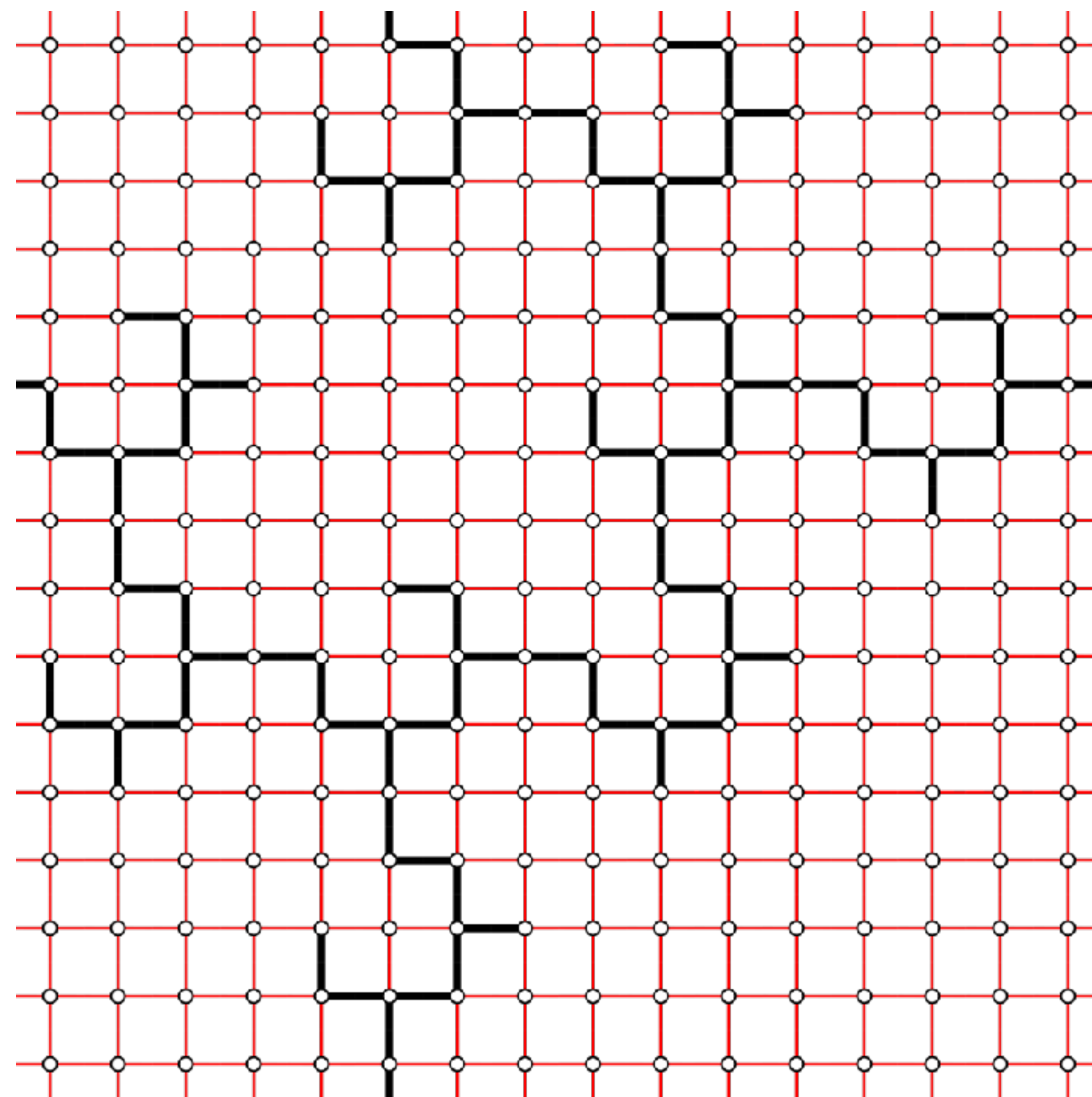
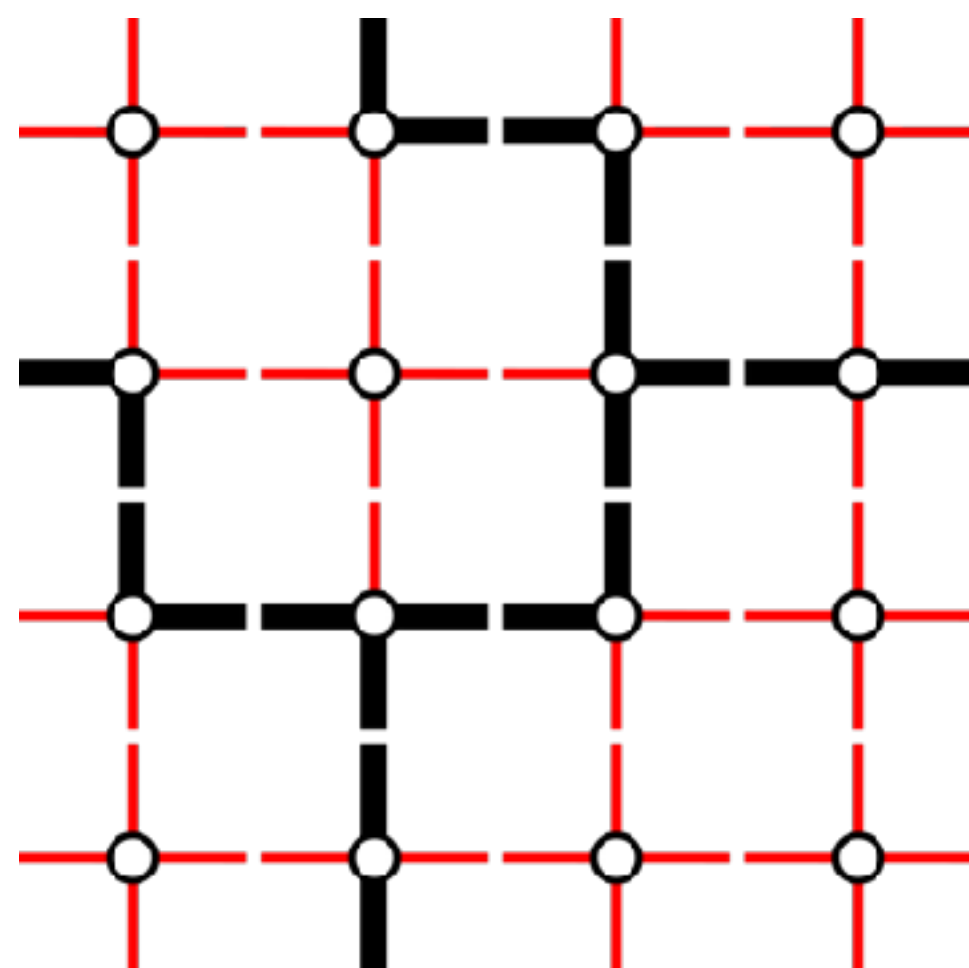
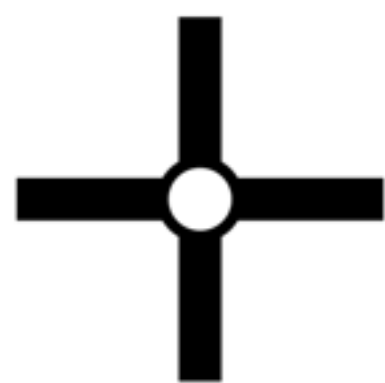
Fractal₂

$J_1 - J_2$



Fractal₃

$J_1 - J_2$



Numerical Results

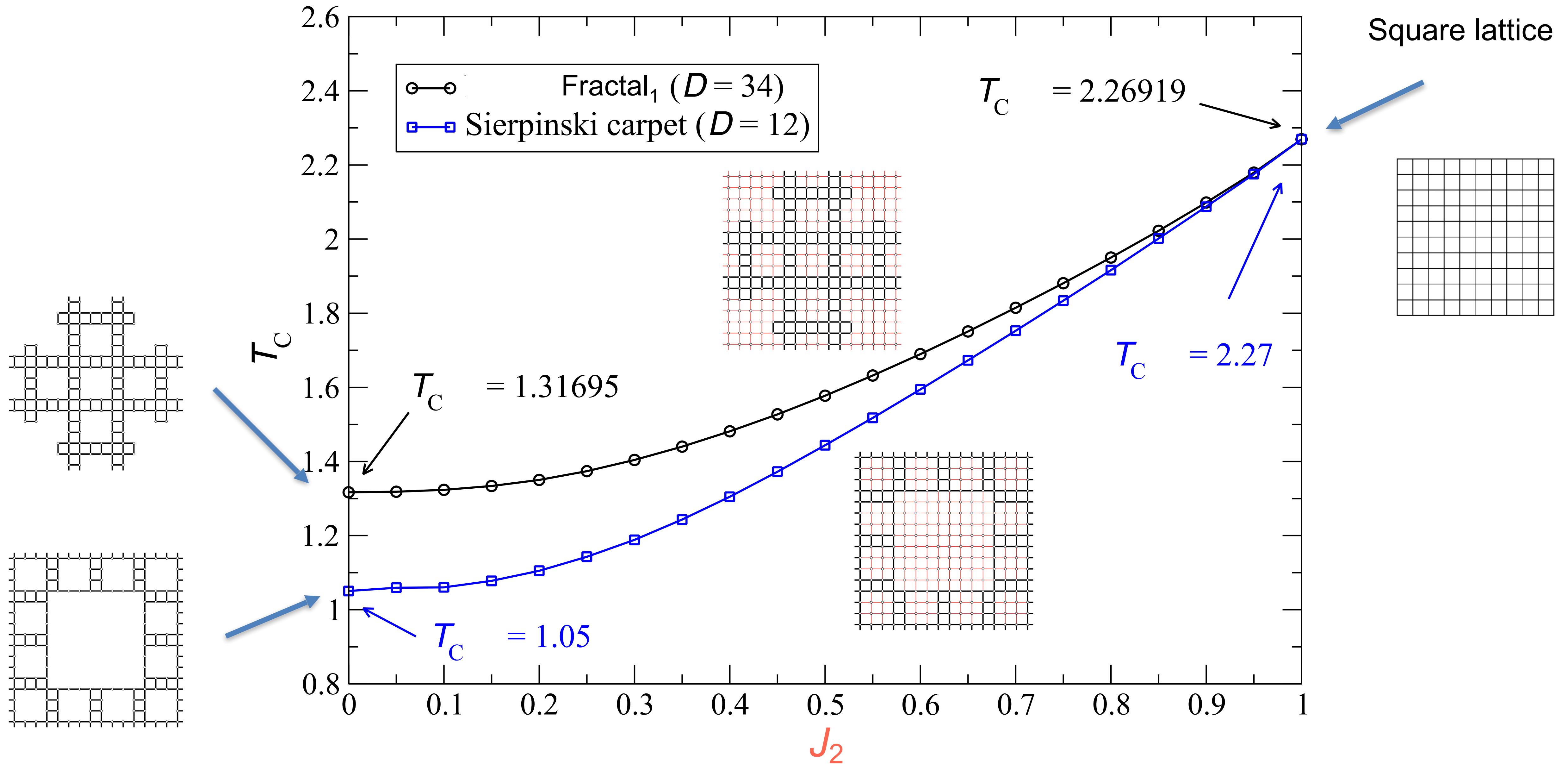
Critical temperature T_C (for $J_1 = 1$)

	$J_2=0$ (Fractal)	$J_2=1$ (Square lattice)
Comparison	1.31717*	
J_1-J_2	1.31695 ($D=16-34$)	2.26919 ($D=34$)
Relative error/difference	$\sim 0.02\%$	$\sim 0.0002\%$

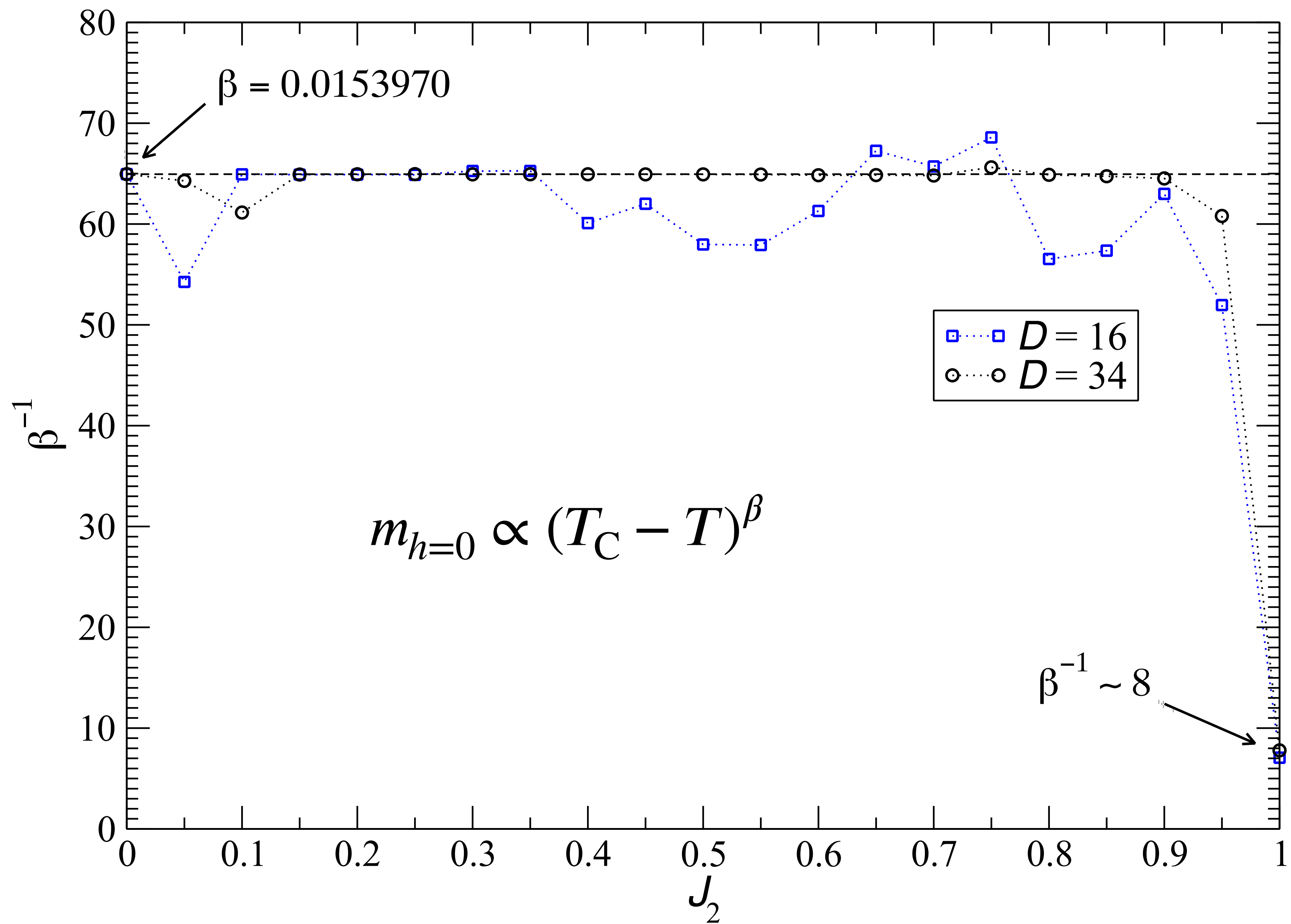
Critical exponent β

	$J_2=0$ (Fractal)	$J_2=1$ (Square lattice)
Comparison	0.01388*	0.125
J_1-J_2	0.0153970 ($D=34$)	0.128 ($D=34$)
Relative error/difference	$\sim 10\%$	$\sim 2.4\%$

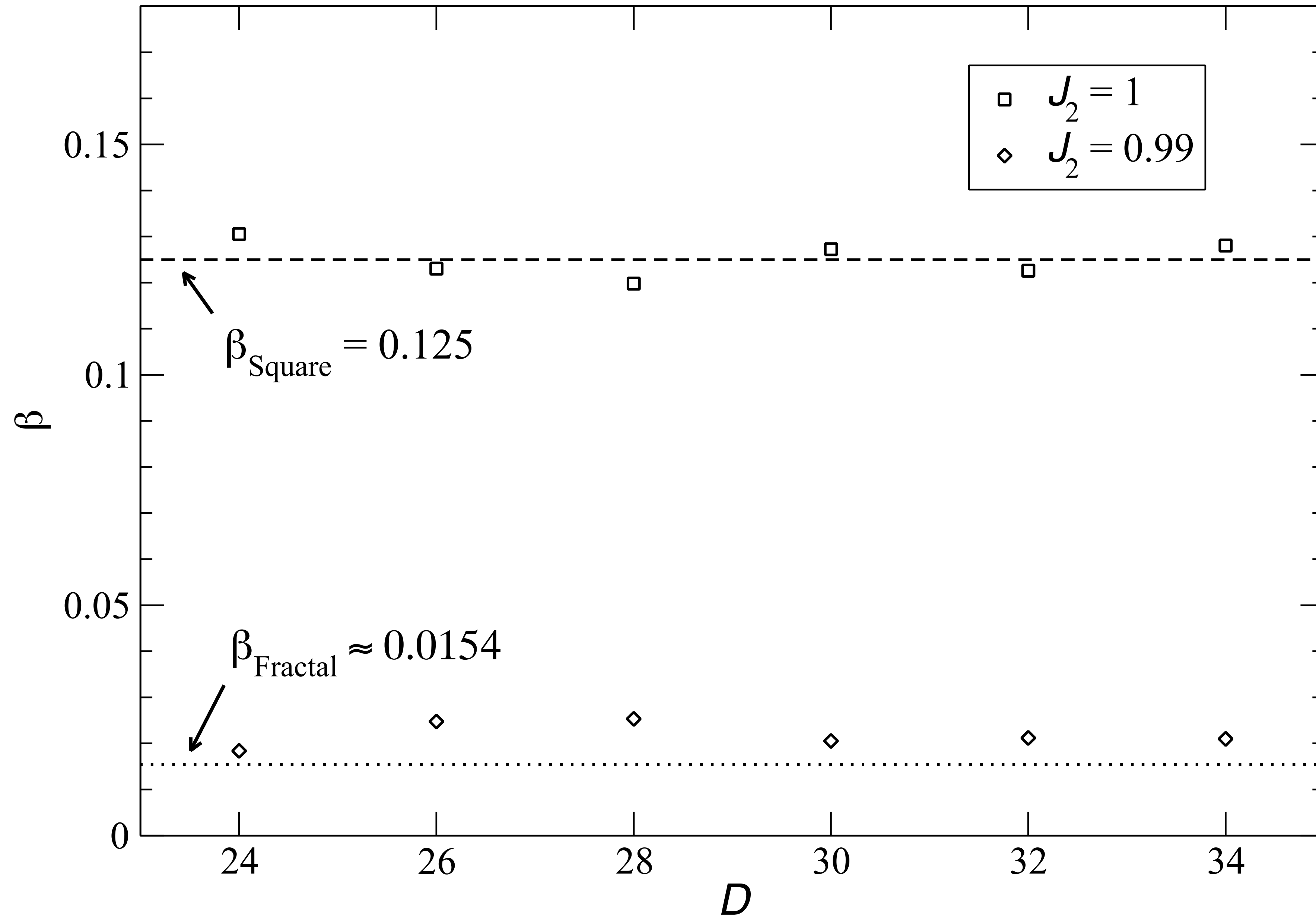
Critical temperature T_C as a function of $0 \leq J_2 \leq 1$ (if $J_1=1$)



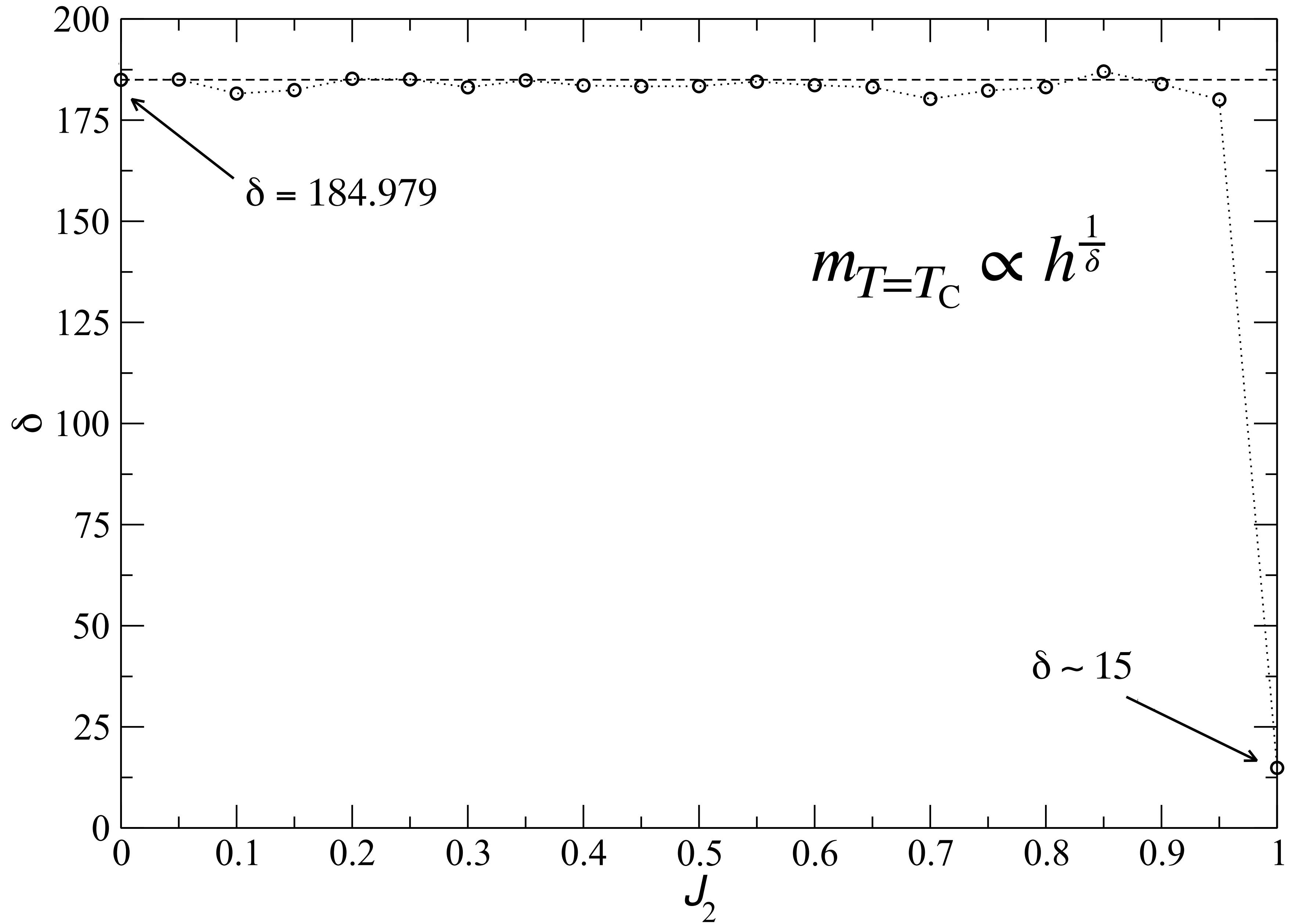
Critical exponent β for $J_1 = 1$



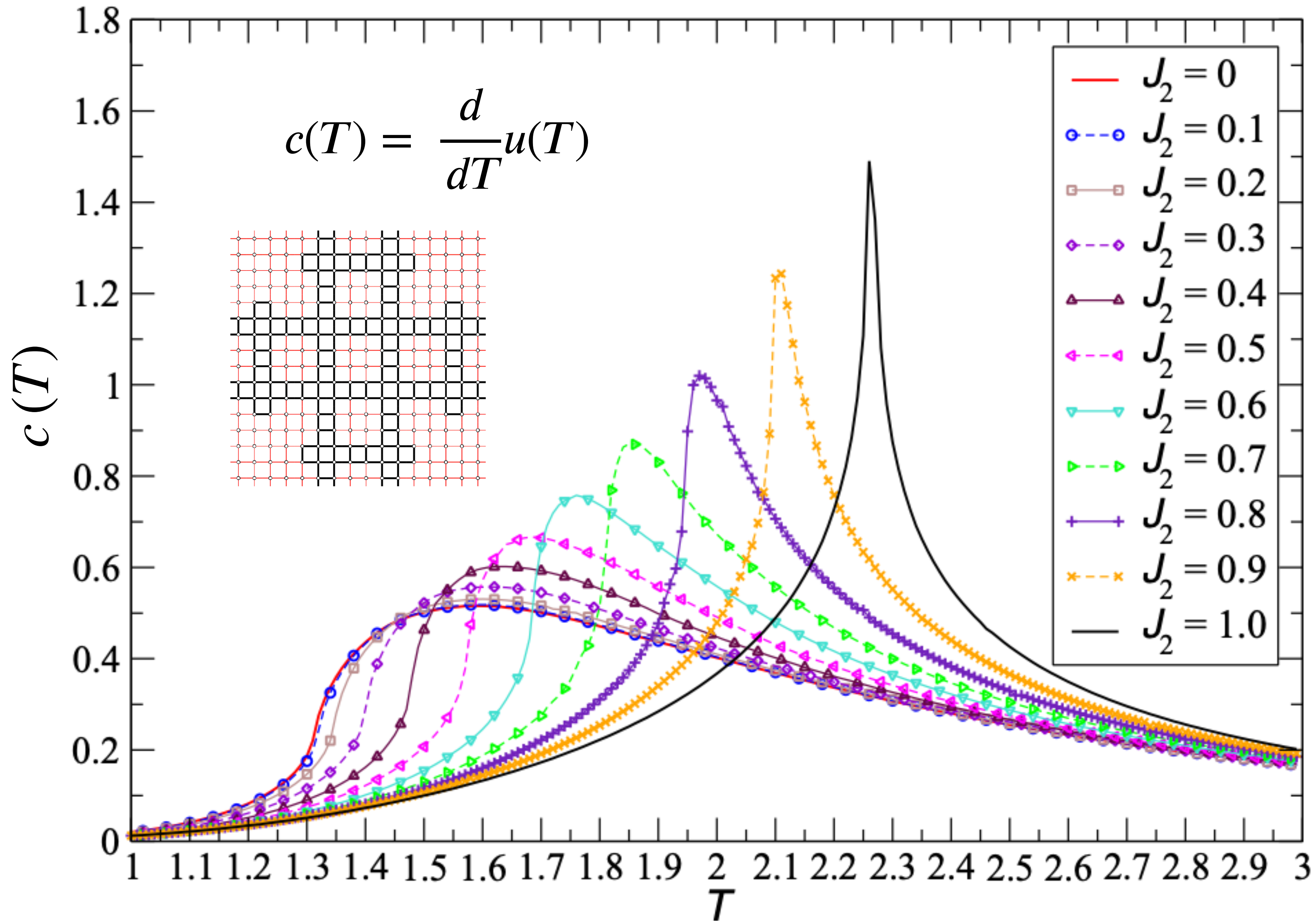
Convergence of β w.r.t. D for $J_1 = 1$



Critical exponent δ for $J_1 = 1$ ($D = 34$)

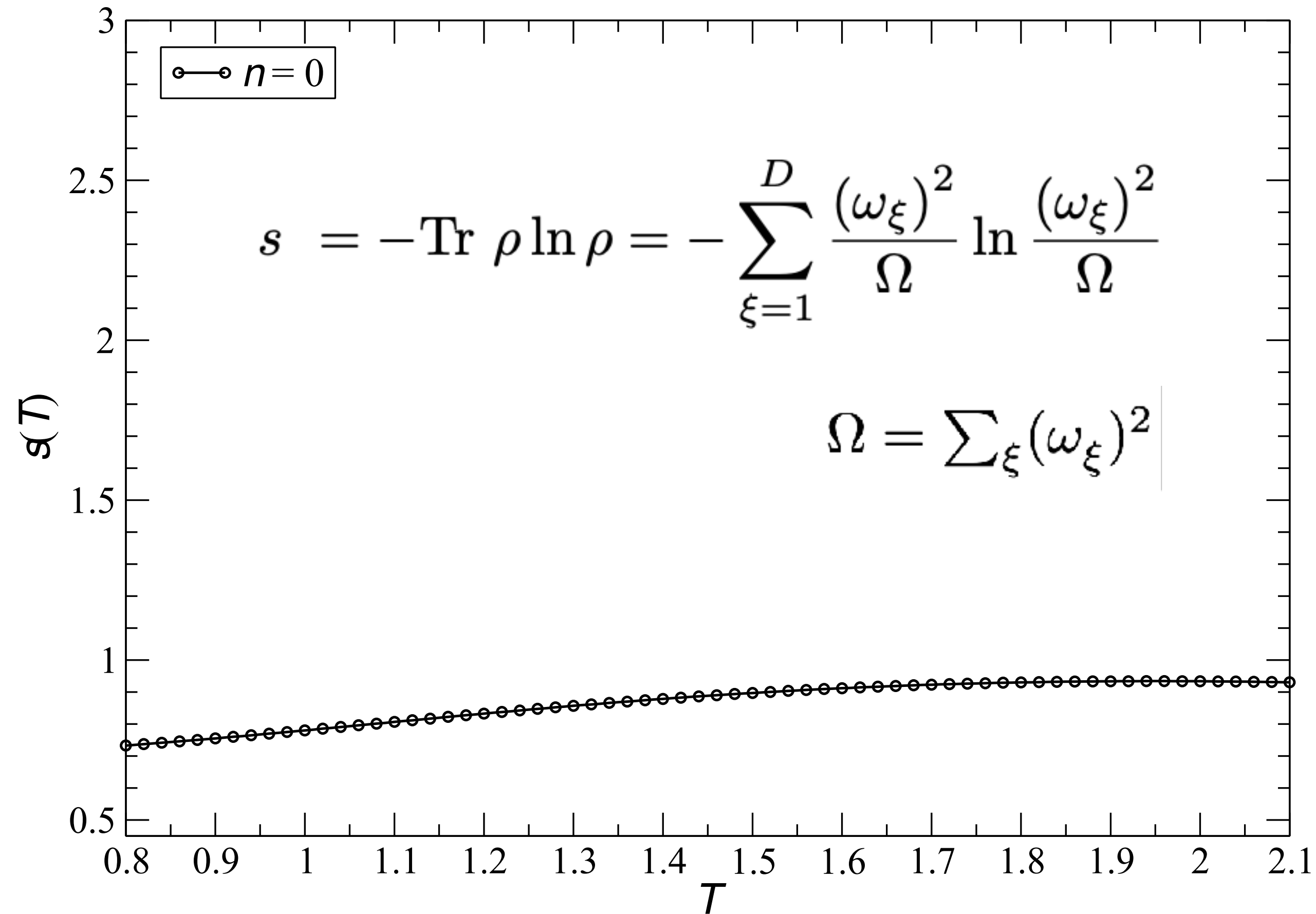


“Anomalous” specific heat for $J_1 = 1$, $0 \leq J_2 \leq 1$



Case study: Entropy flow for $J_2 = 0.5$

Entanglement
entropy

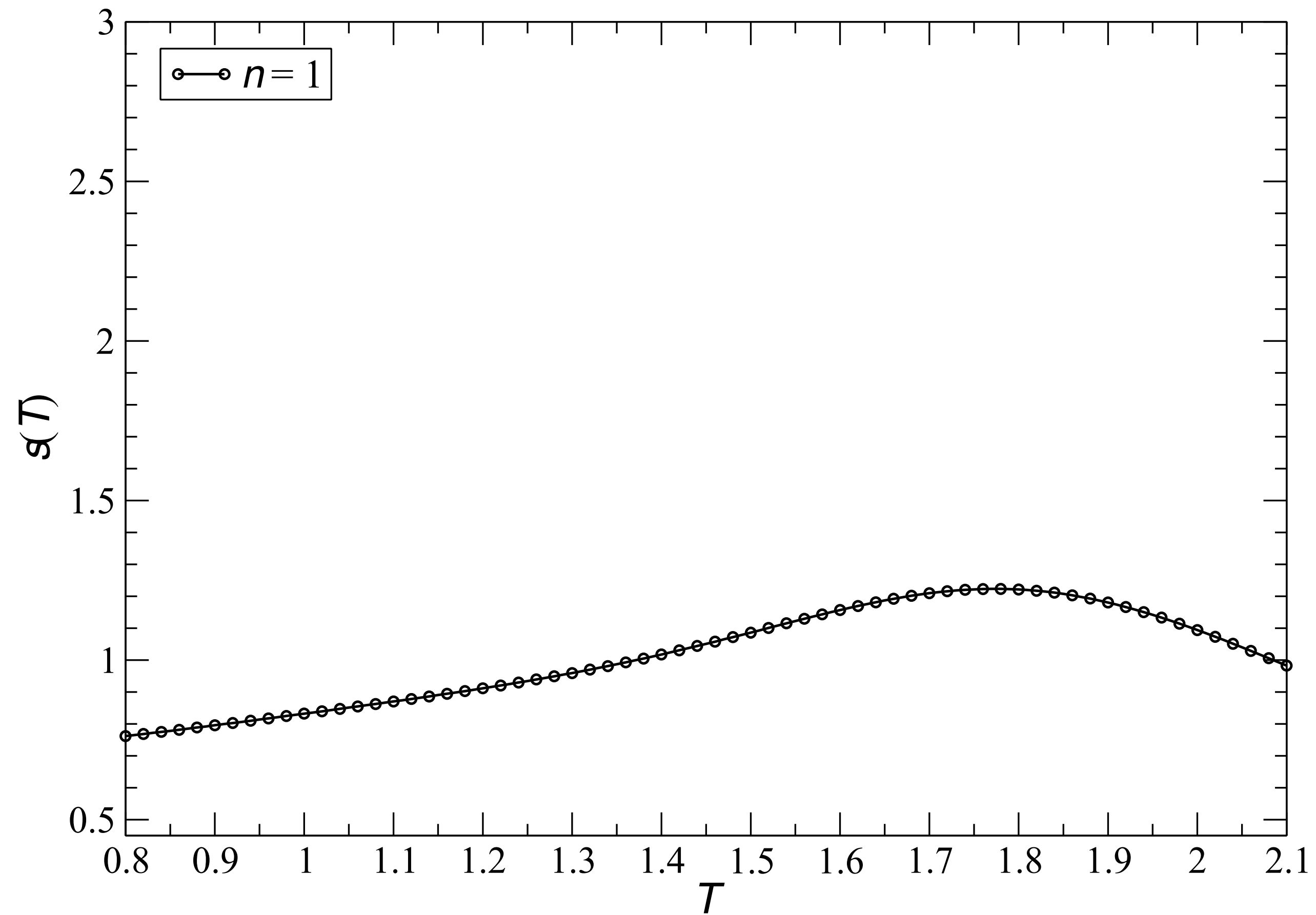


$$\mathcal{T}'_{x(x'yy')}^{[1],n} = \mathcal{T}_{xx'yy'}^{[1],n}$$

$$\mathcal{T}'^{[1],n} = U \omega V^\dagger$$

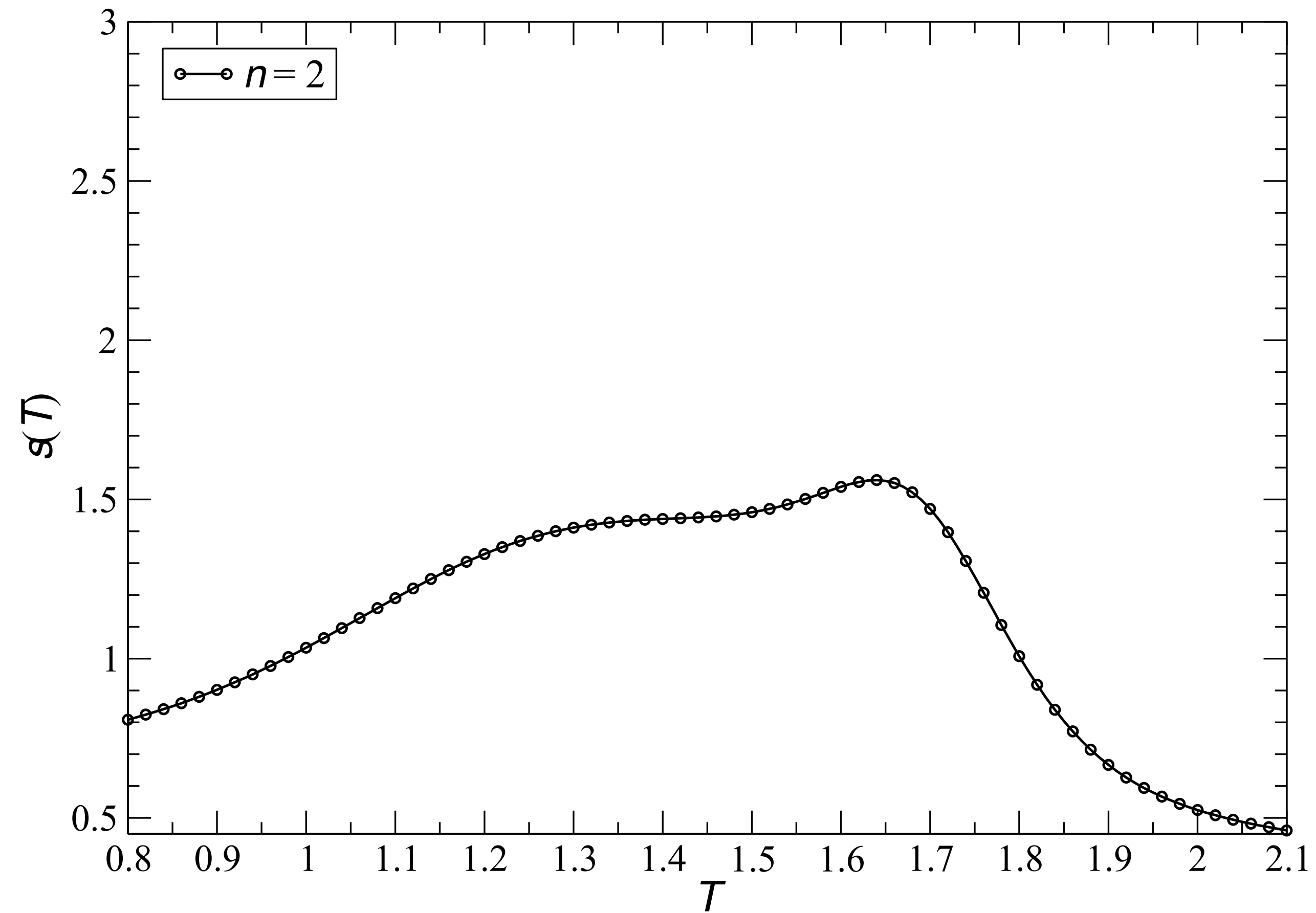
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



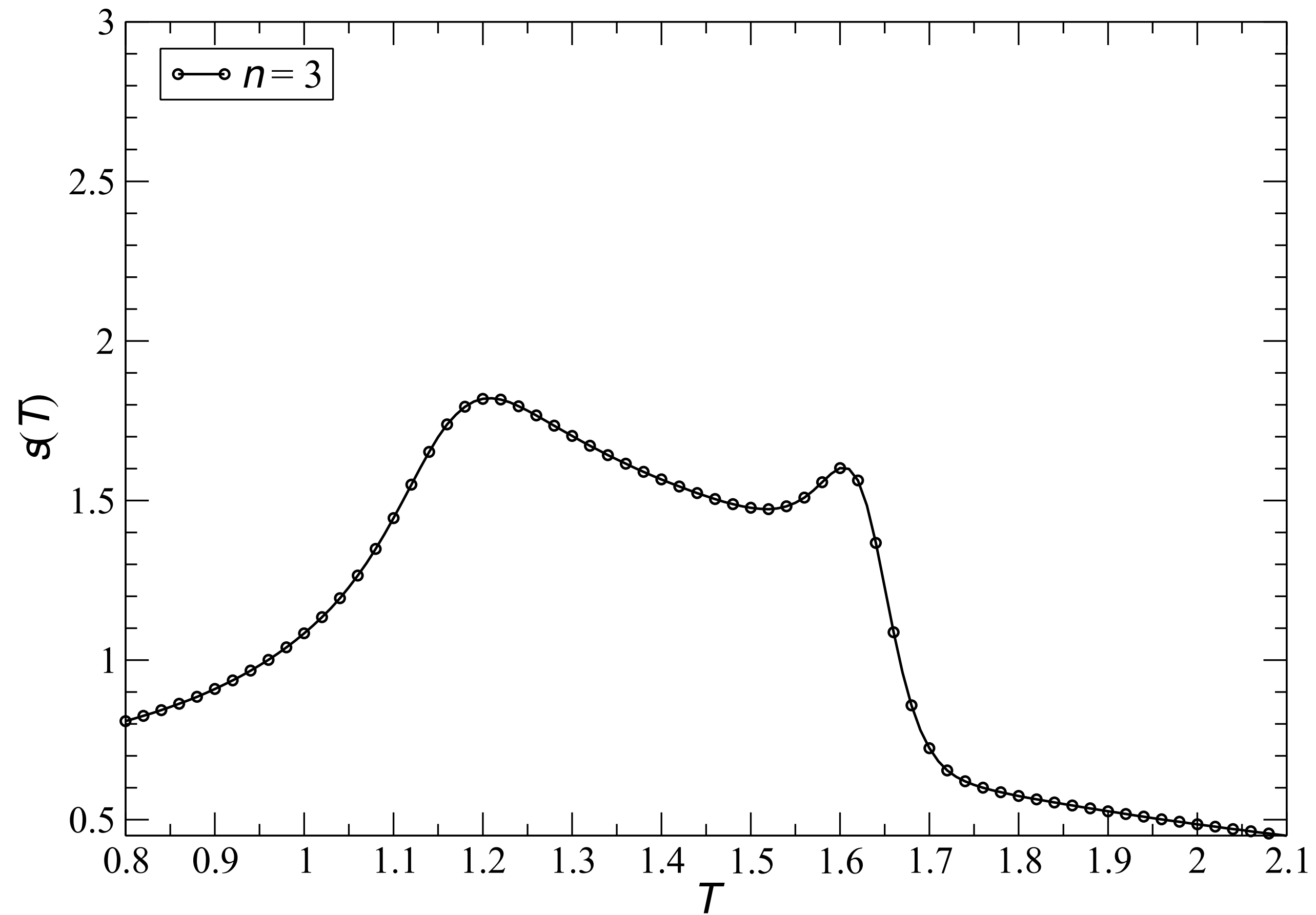
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



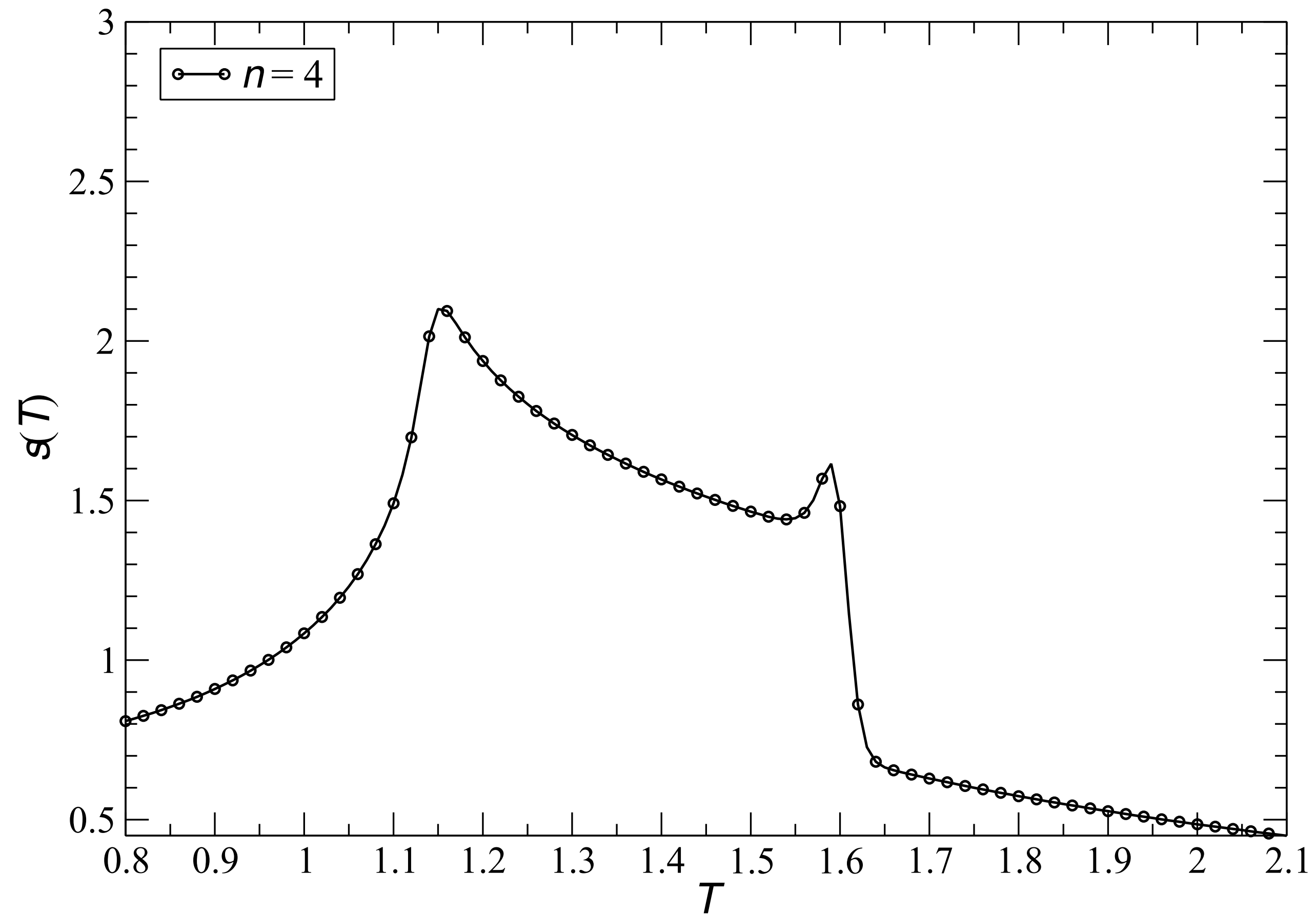
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



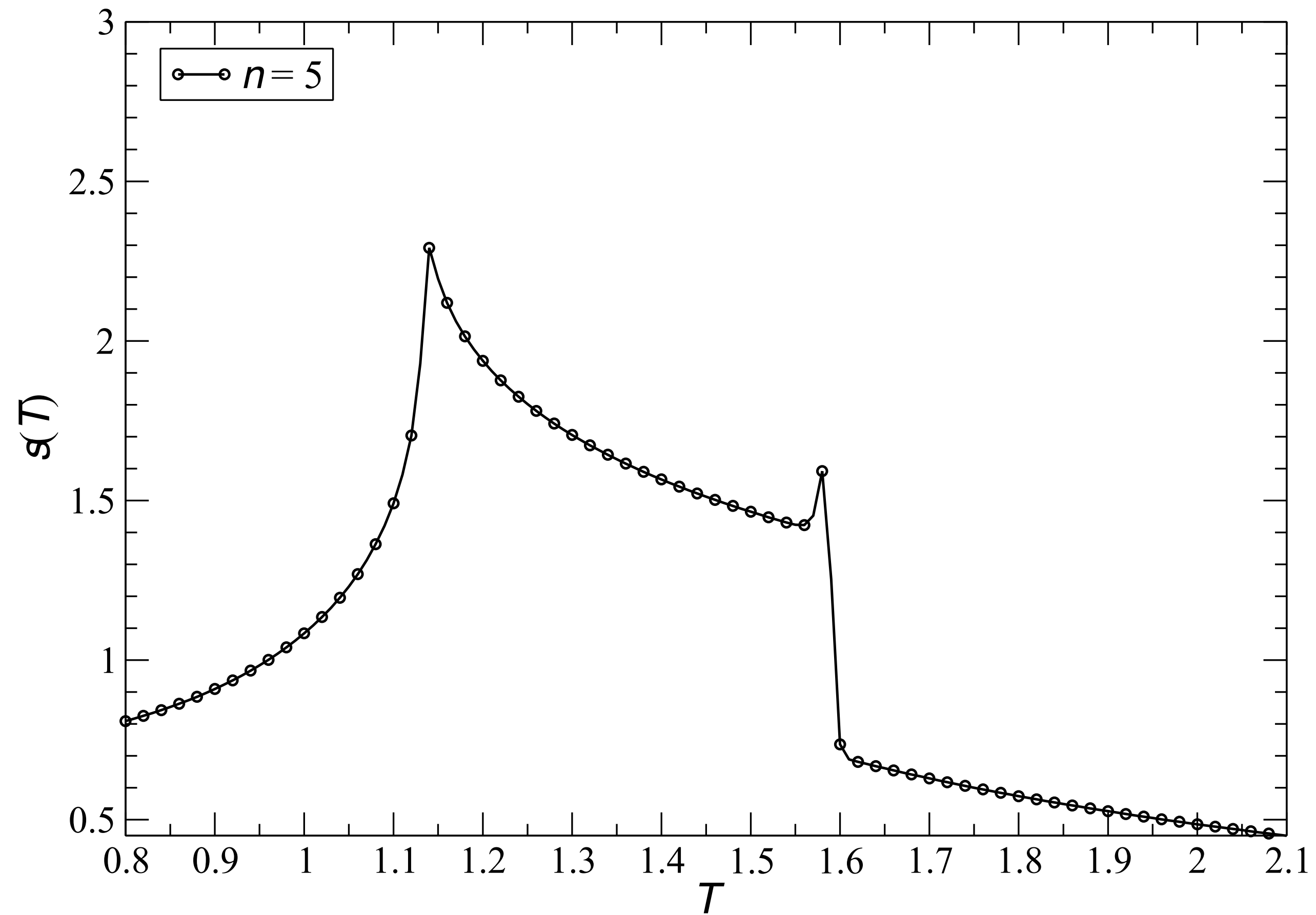
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



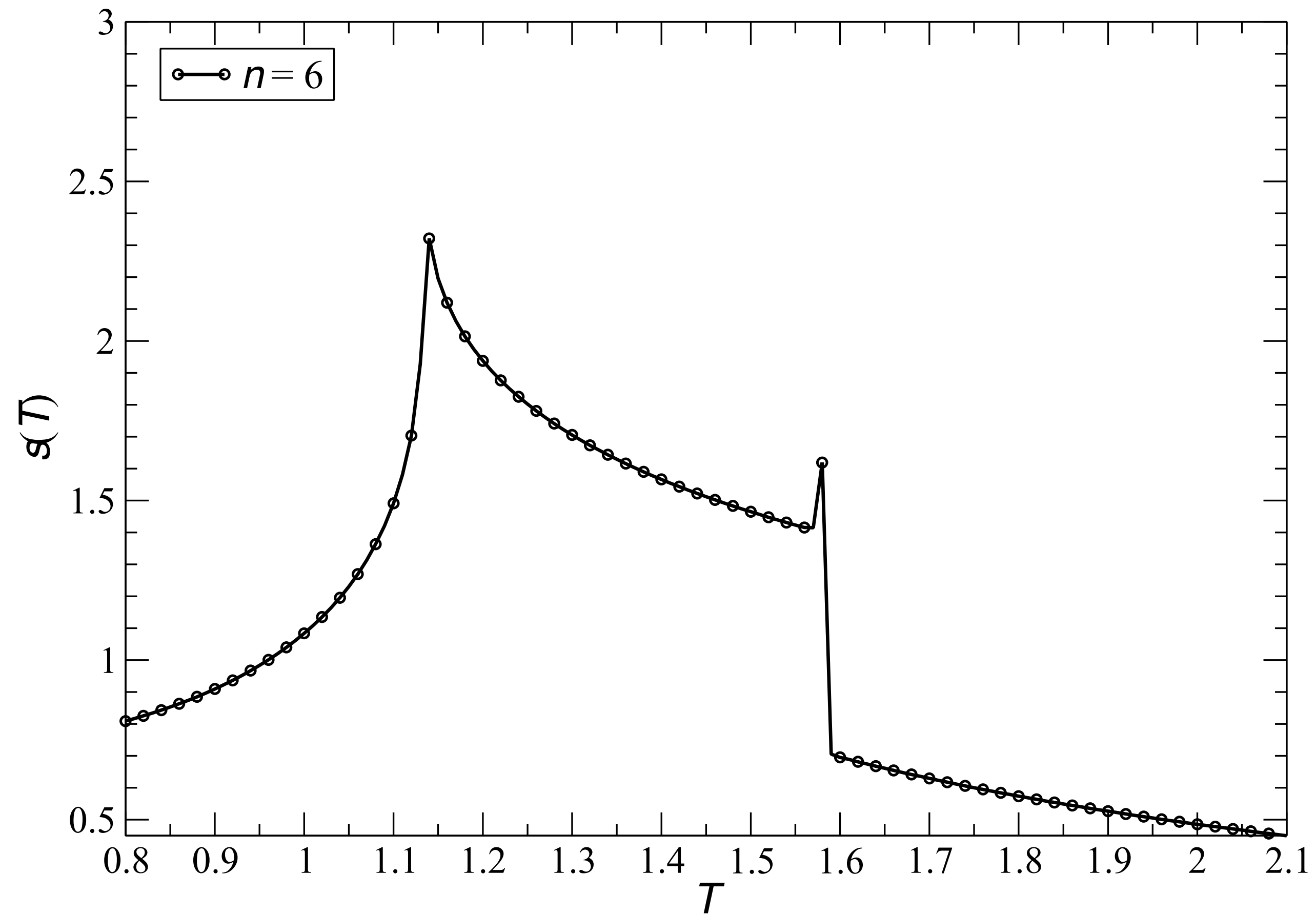
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



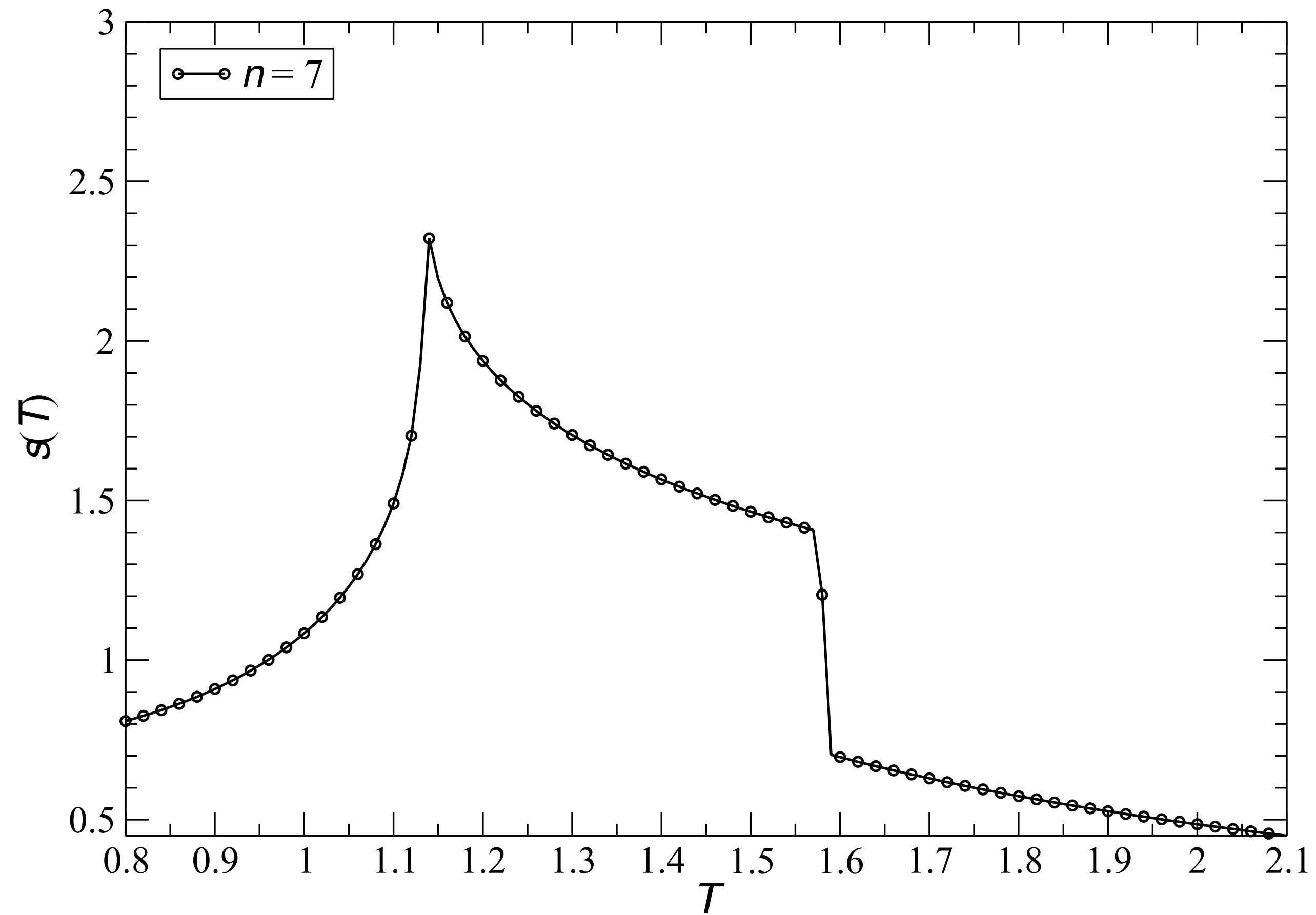
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



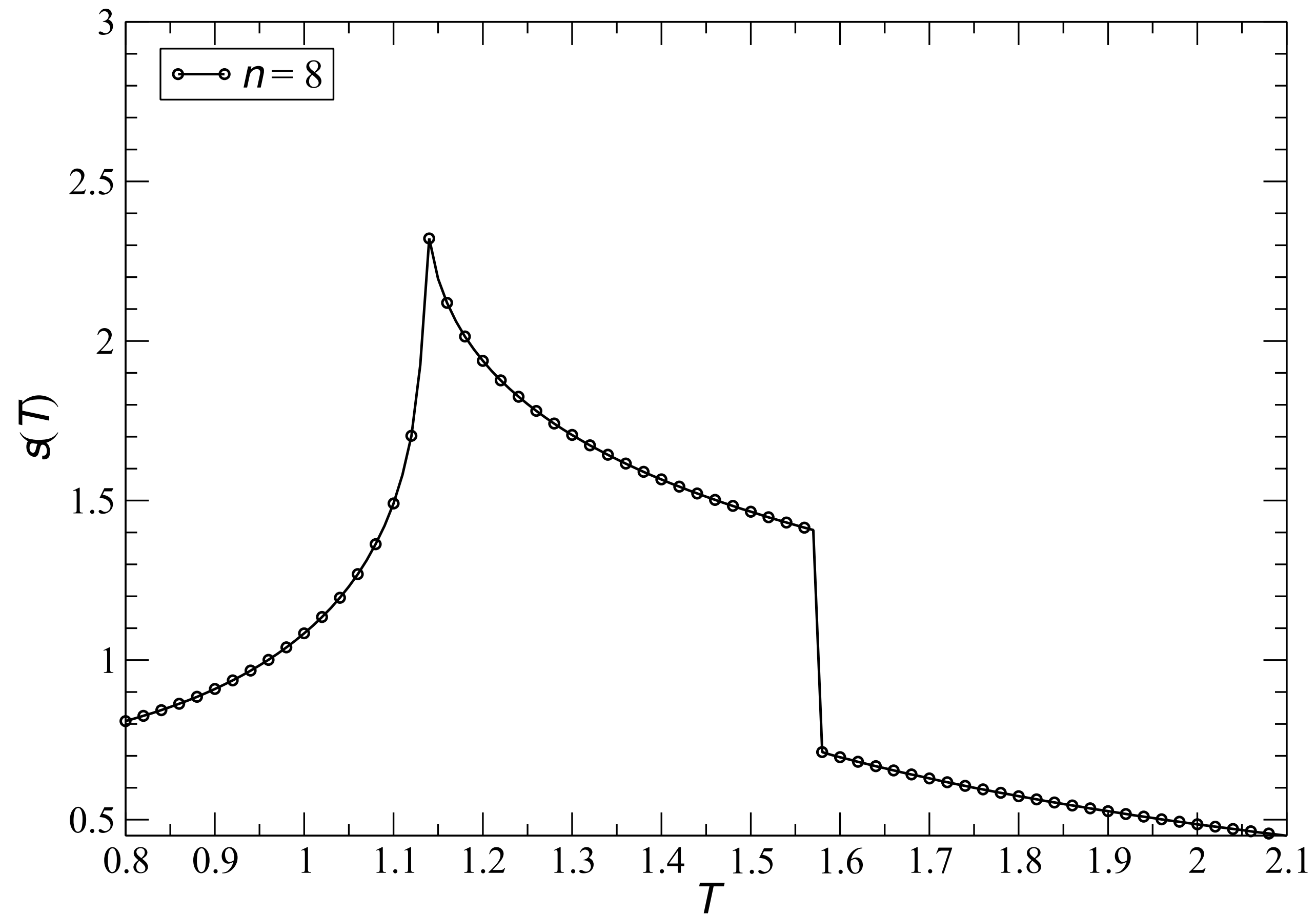
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



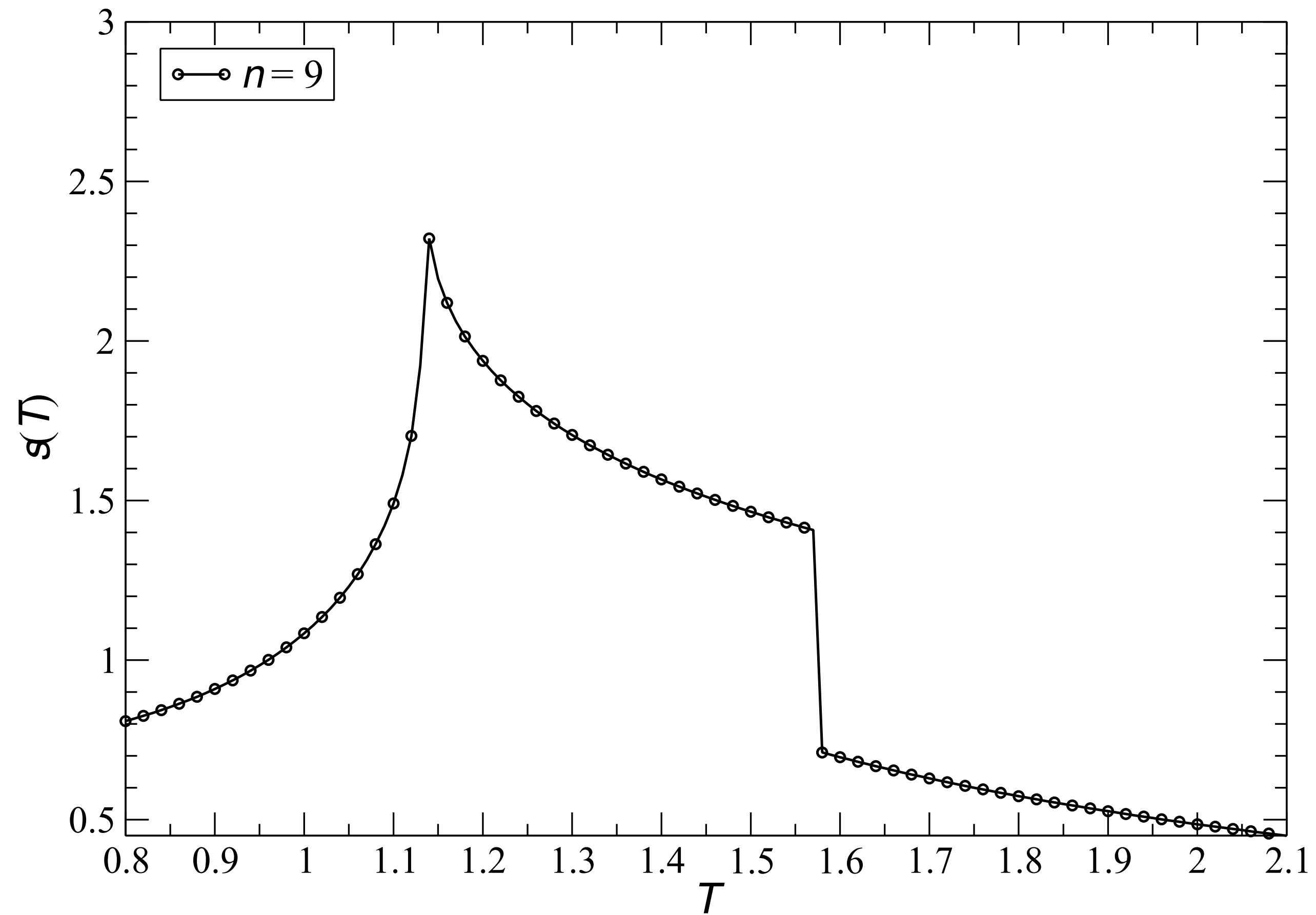
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



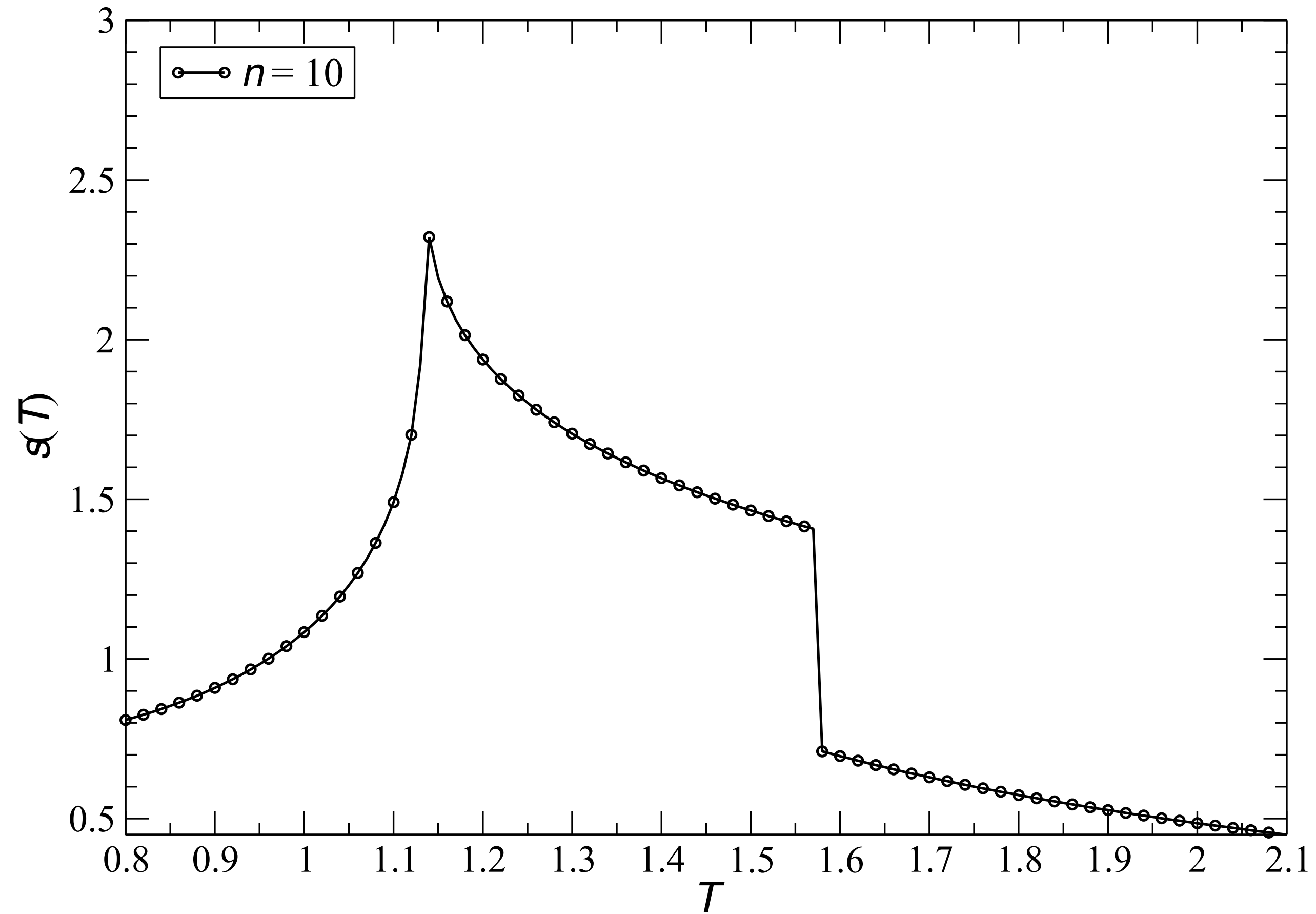
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



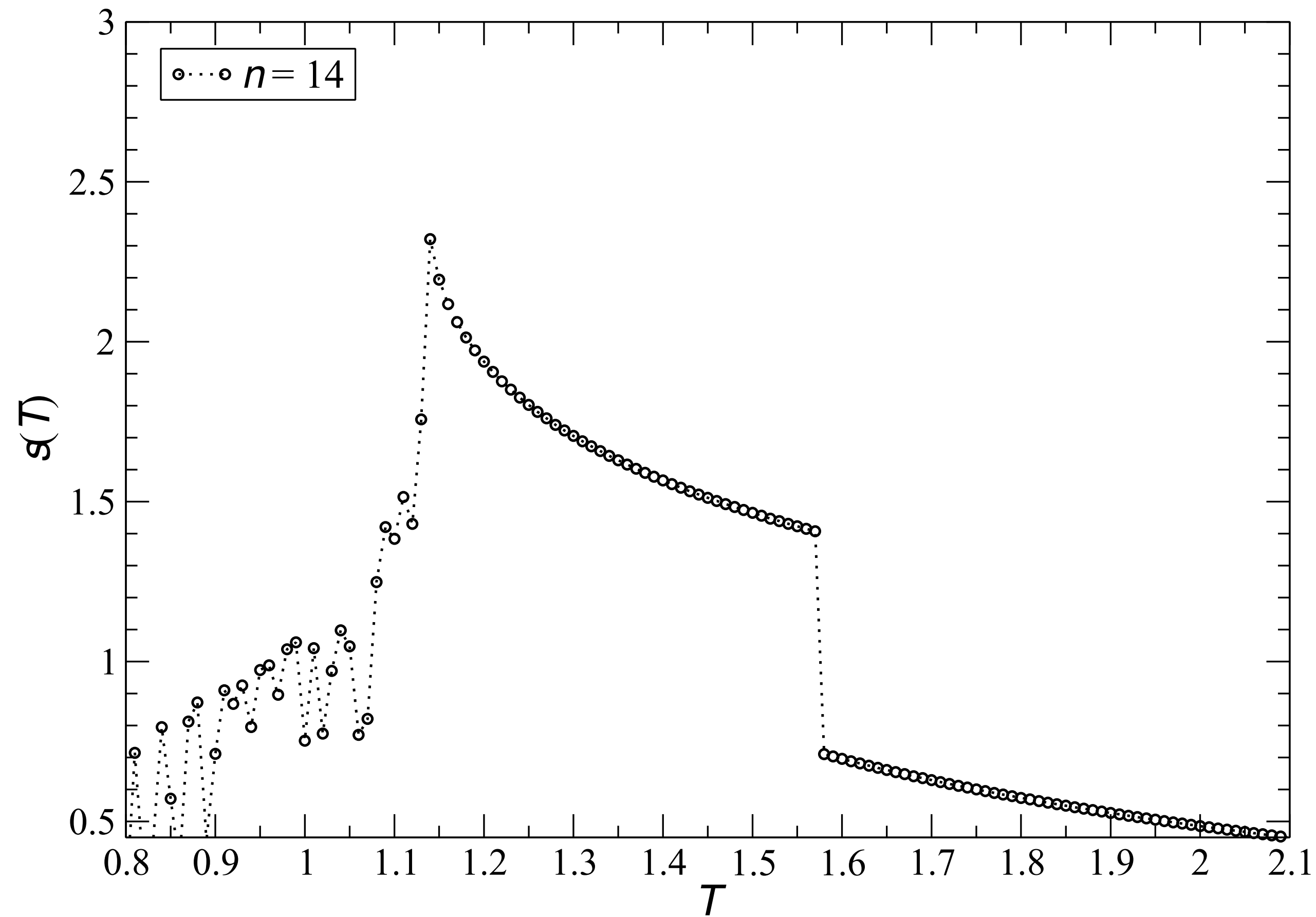
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



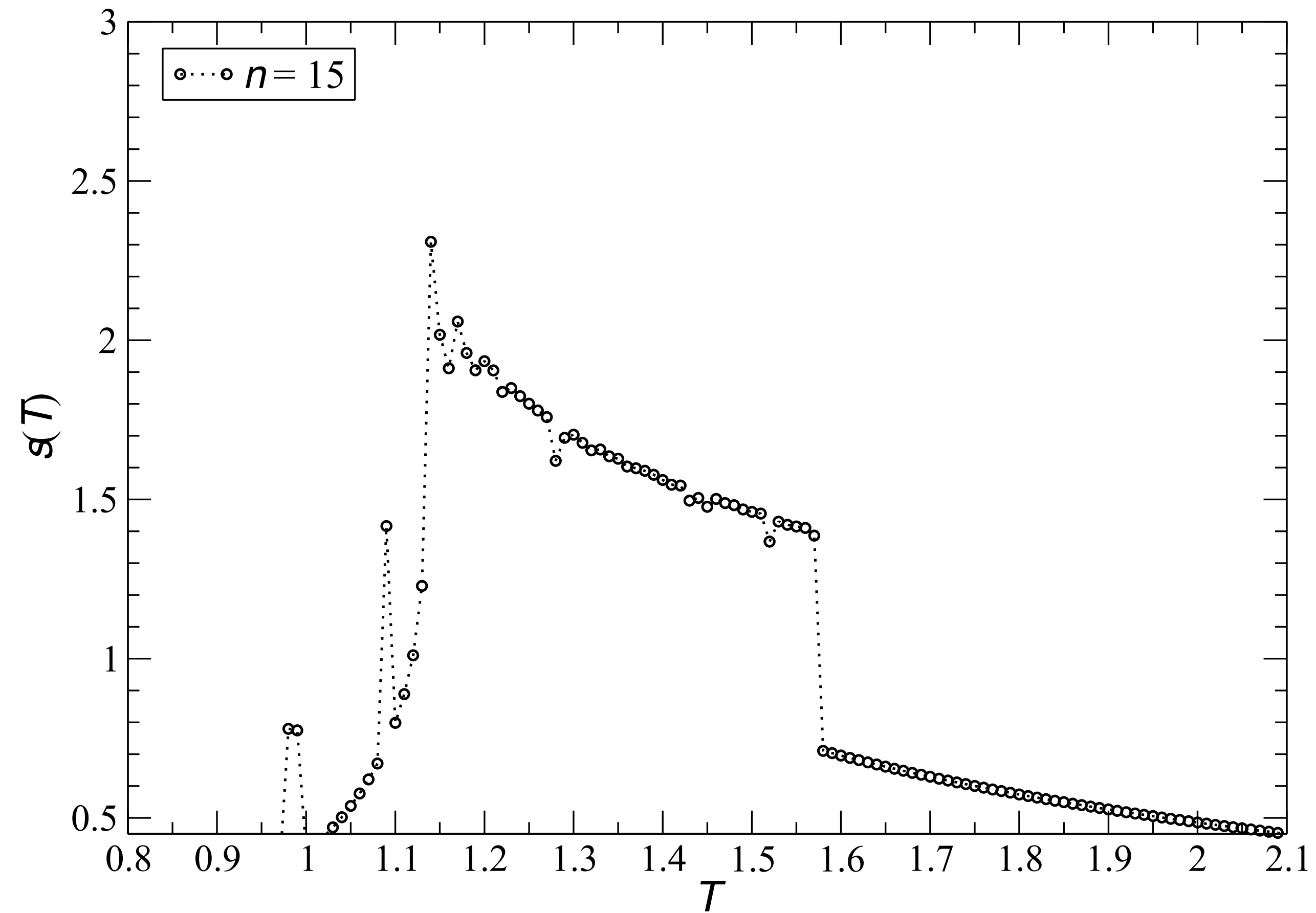
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



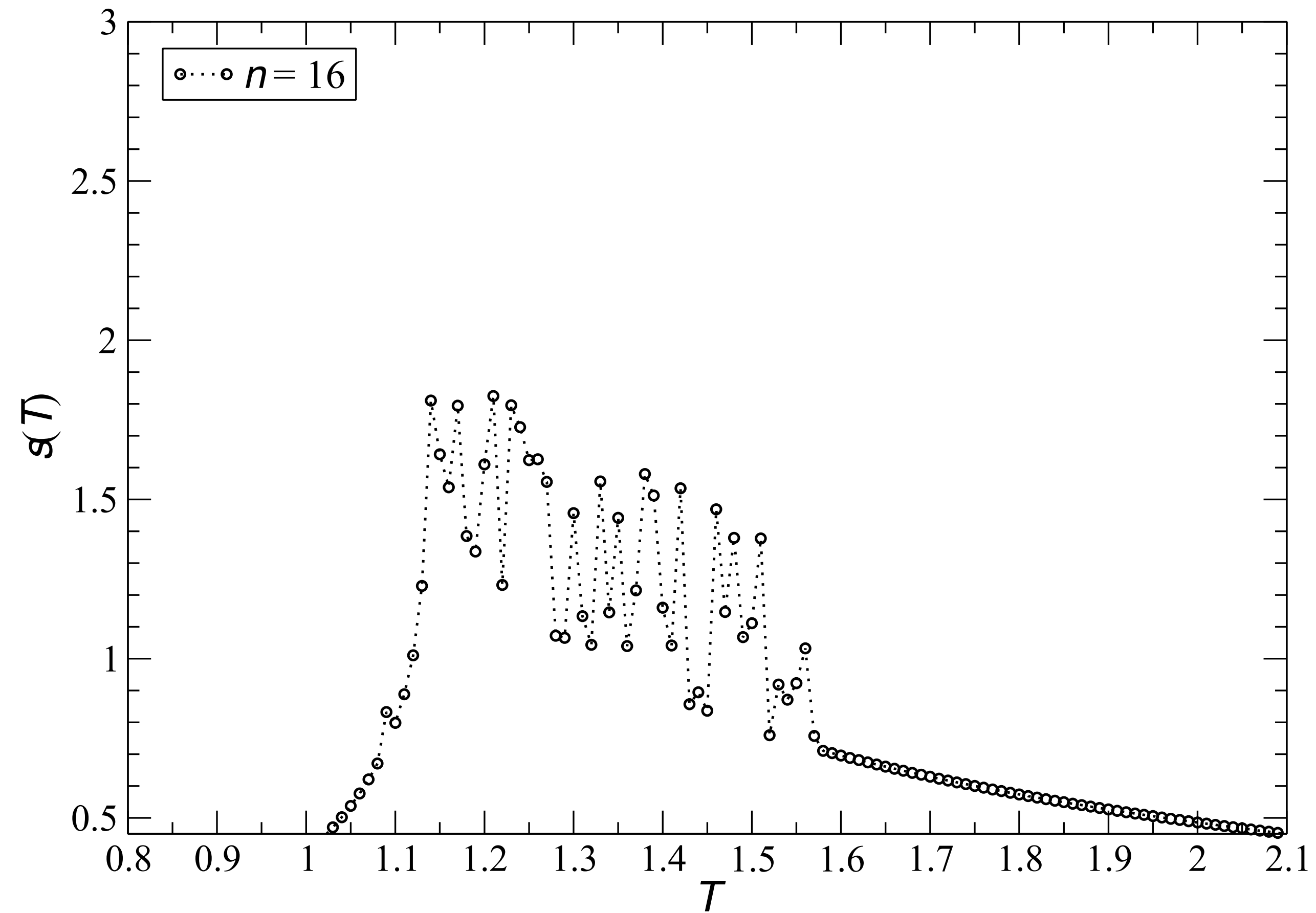
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



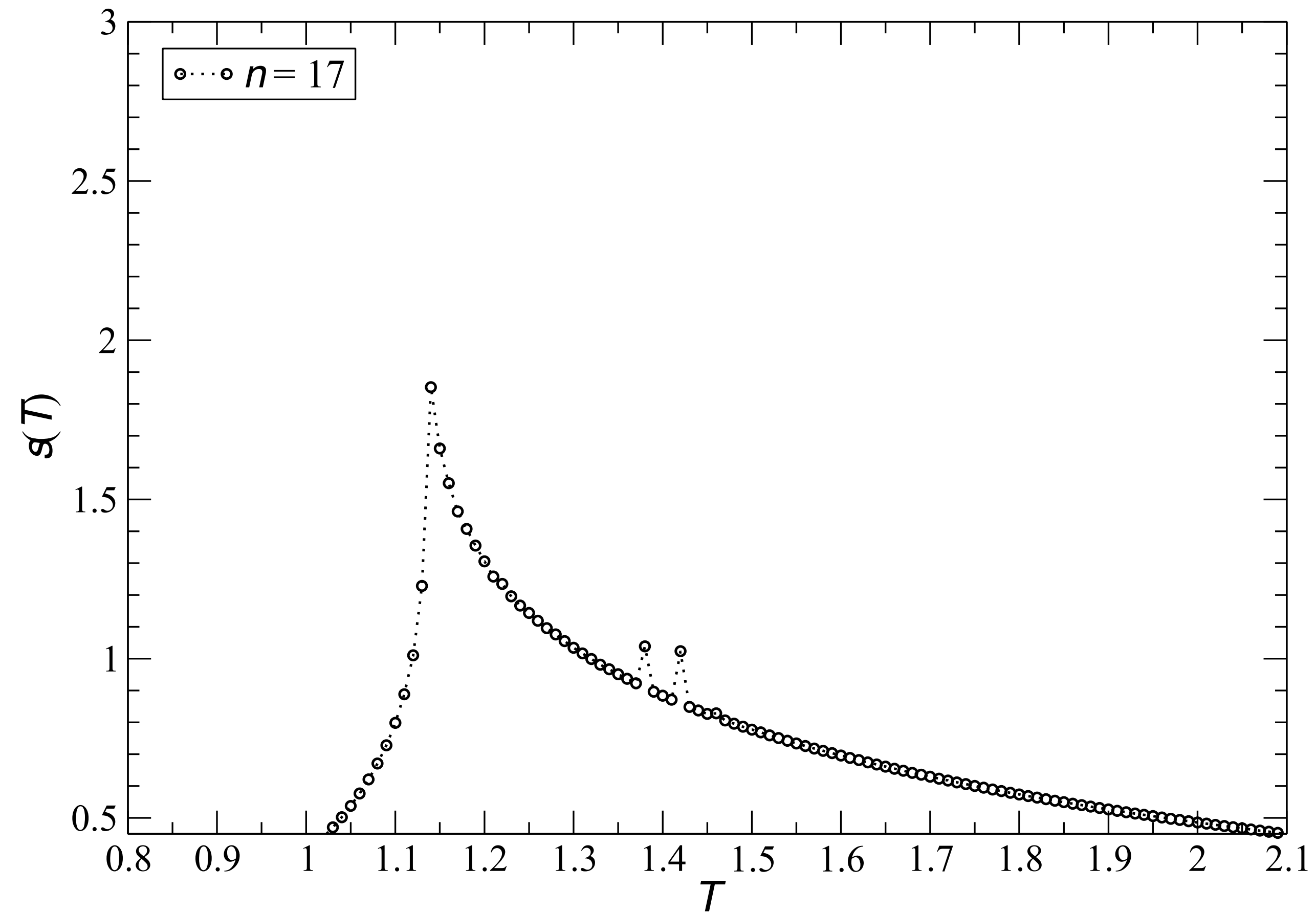
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



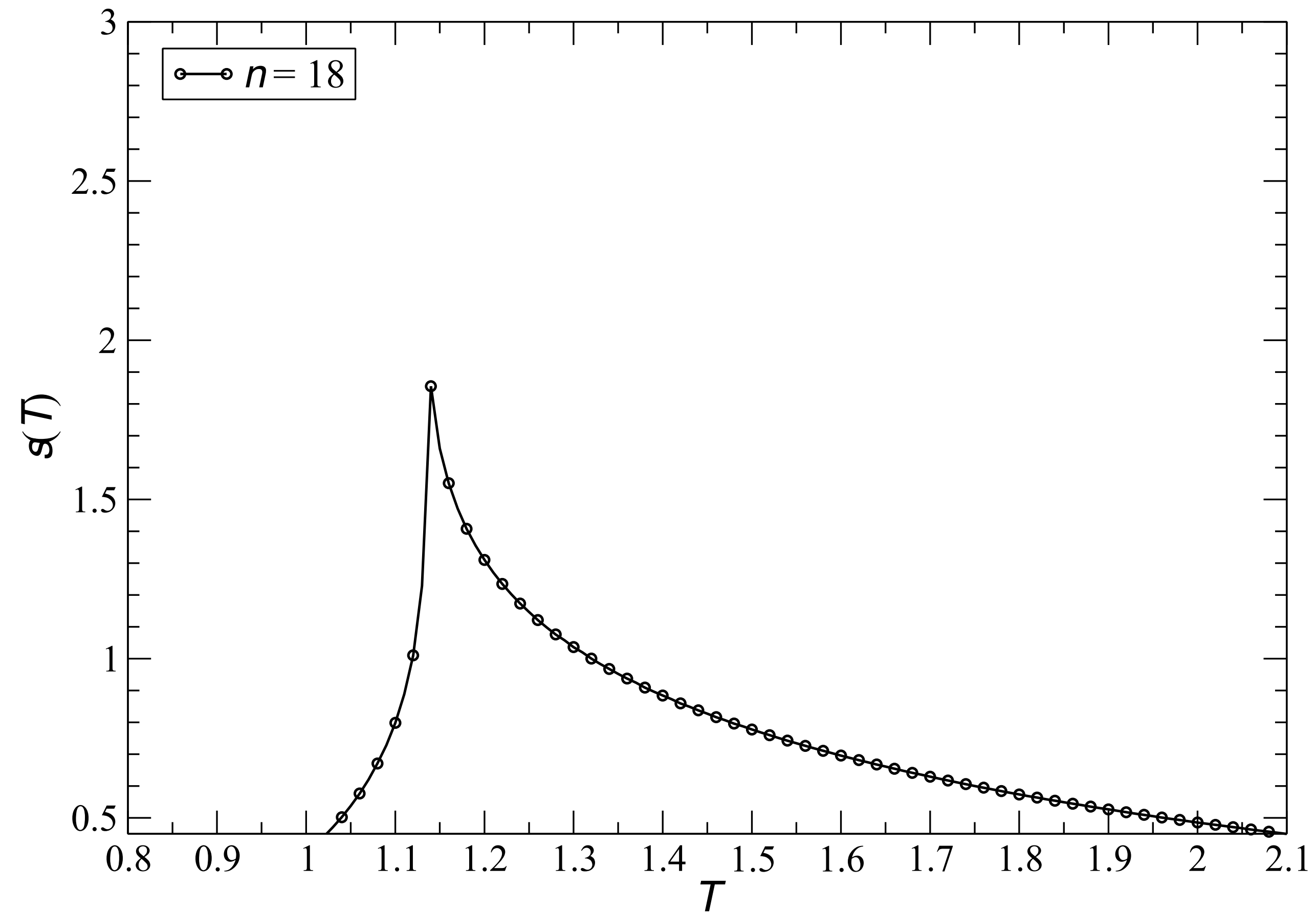
$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$



$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$

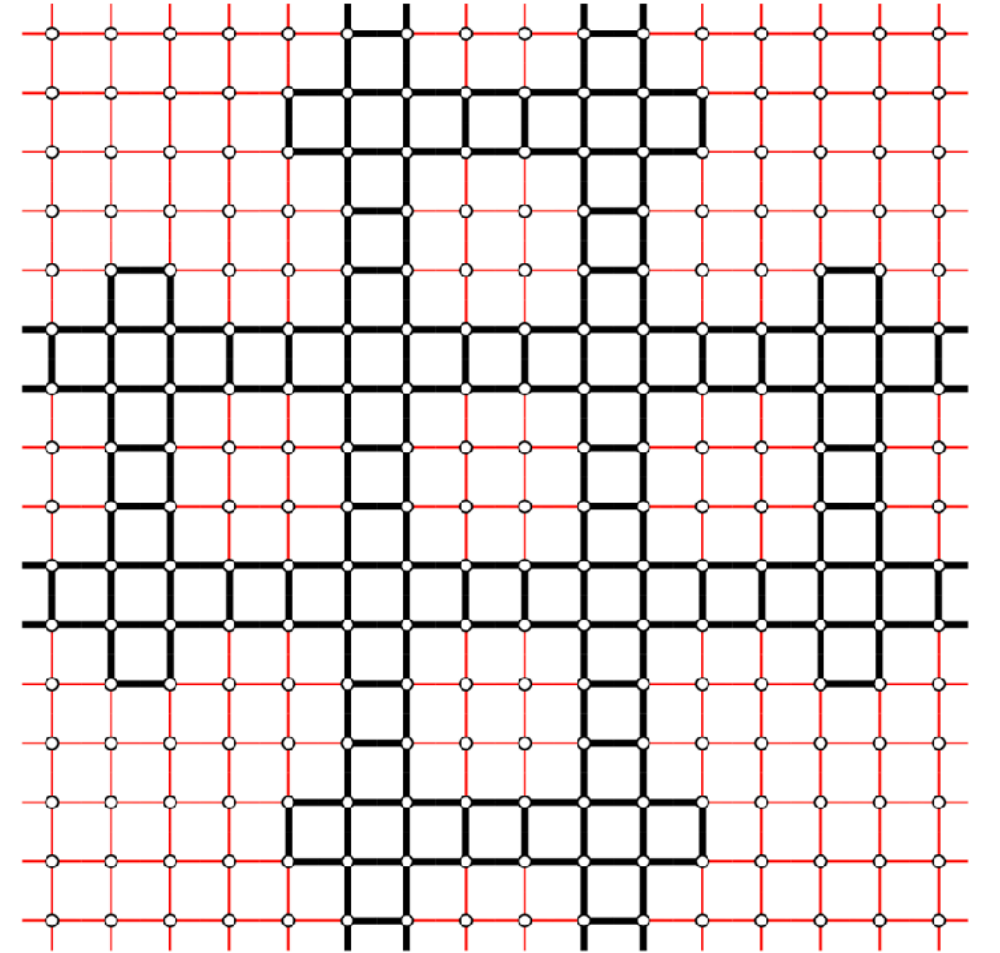
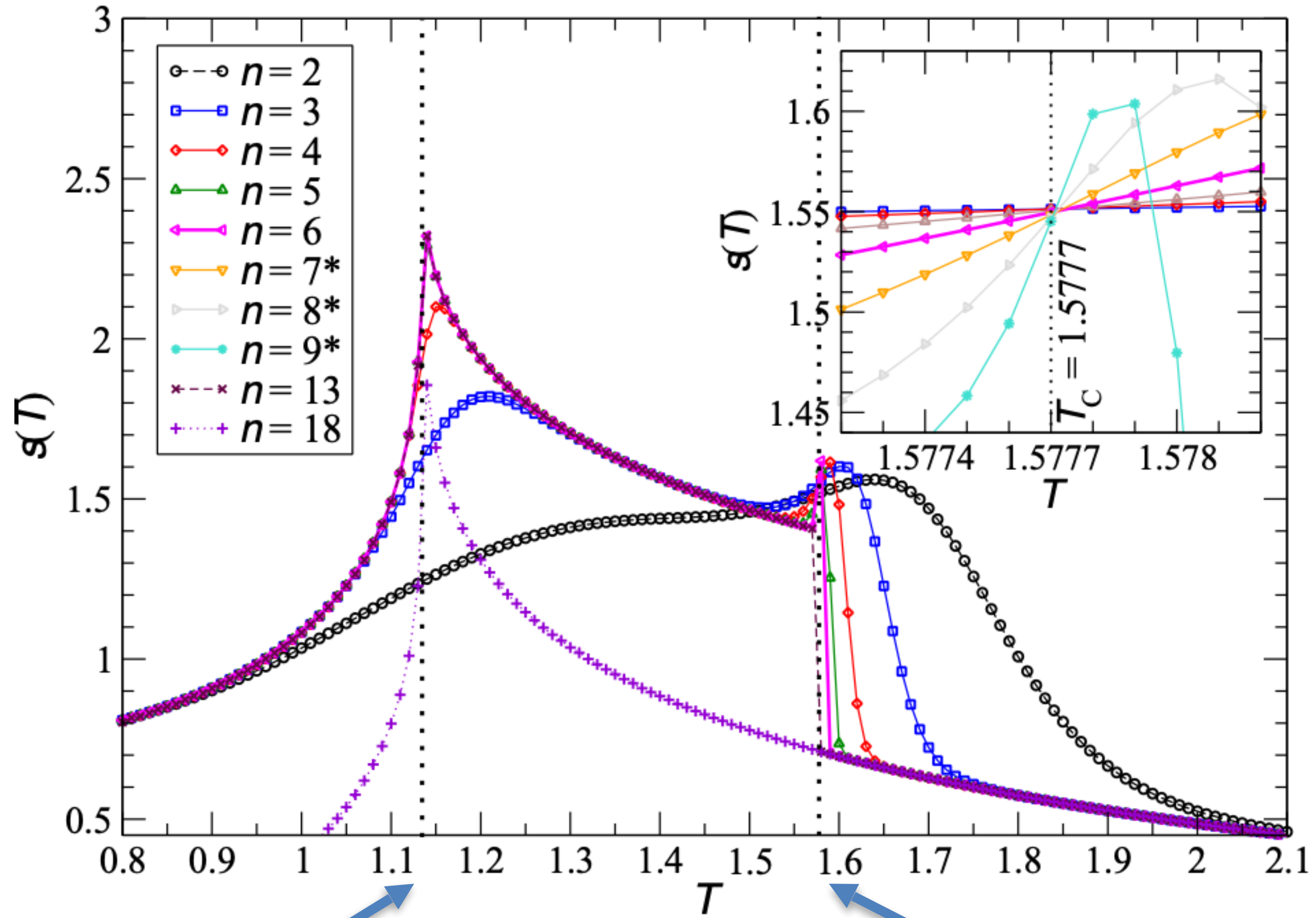


$$T_C(J_2 = 0.5) = 1.5777$$

Case study: Entropy flow for $J_2 = 0.5$

$$T_C^{[1]}(J_2) = J_2 T_C^{\text{Ising}}$$

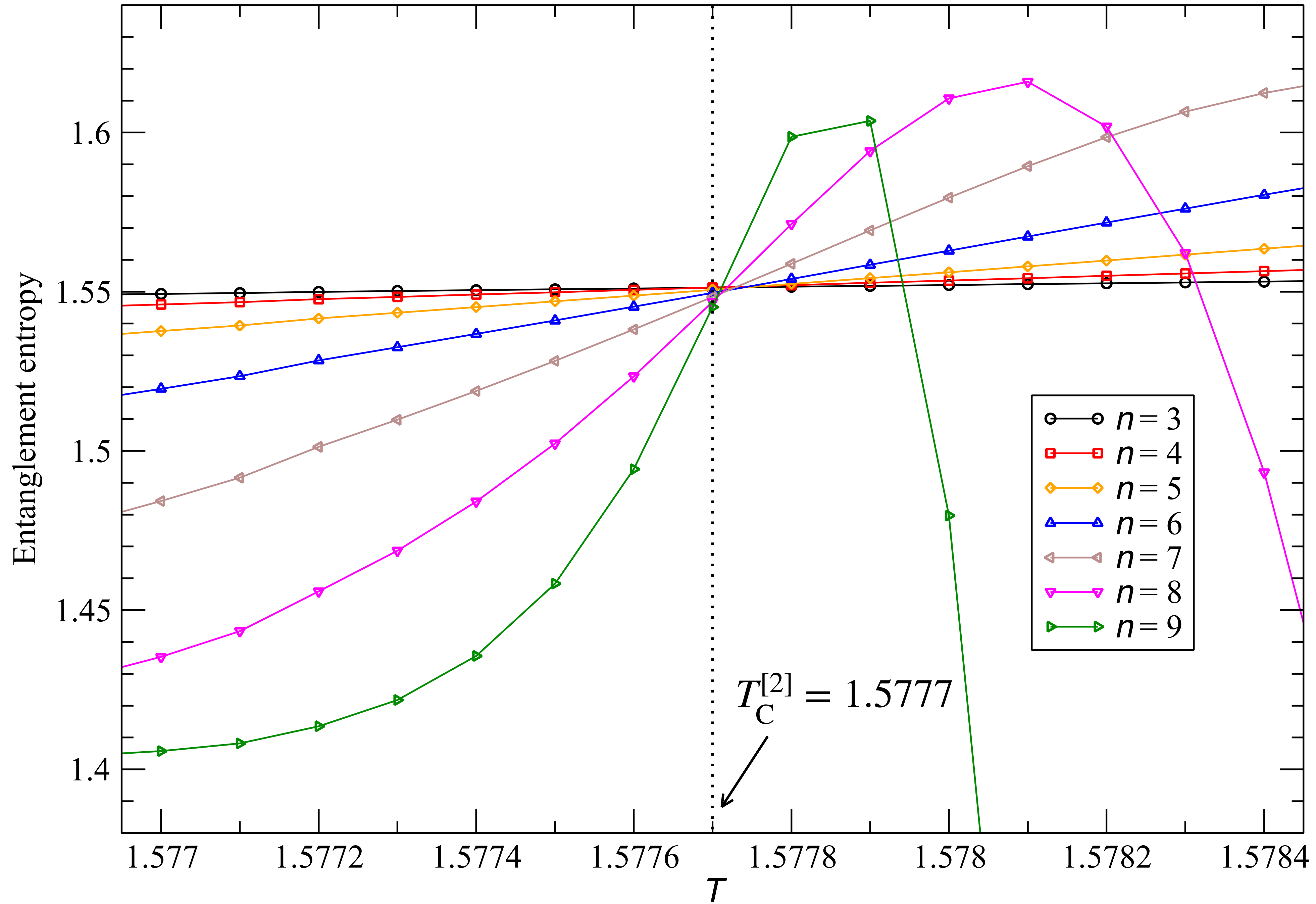
$$= J_2 \frac{2}{\ln(1 + \sqrt{2})}$$



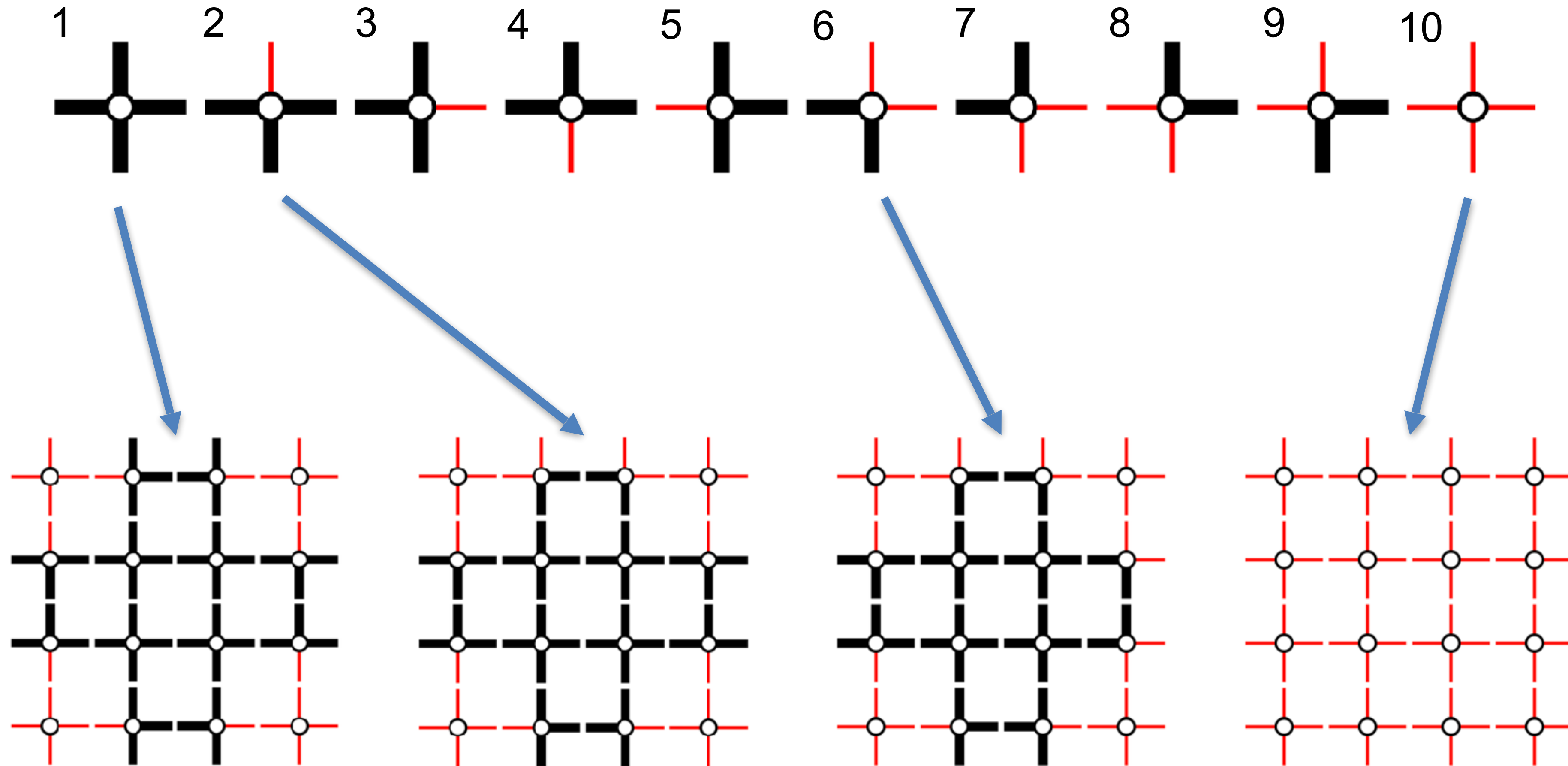
$$T_C^{[1]}(0.5) = \frac{2 \times 0.5}{\ln(1 + \sqrt{2})} \approx 1.13$$

$$T_C^{[2]}(0.5) = 1.5777$$

$J_1 = 1, J_2 = 0.5$ ($D = 16$)

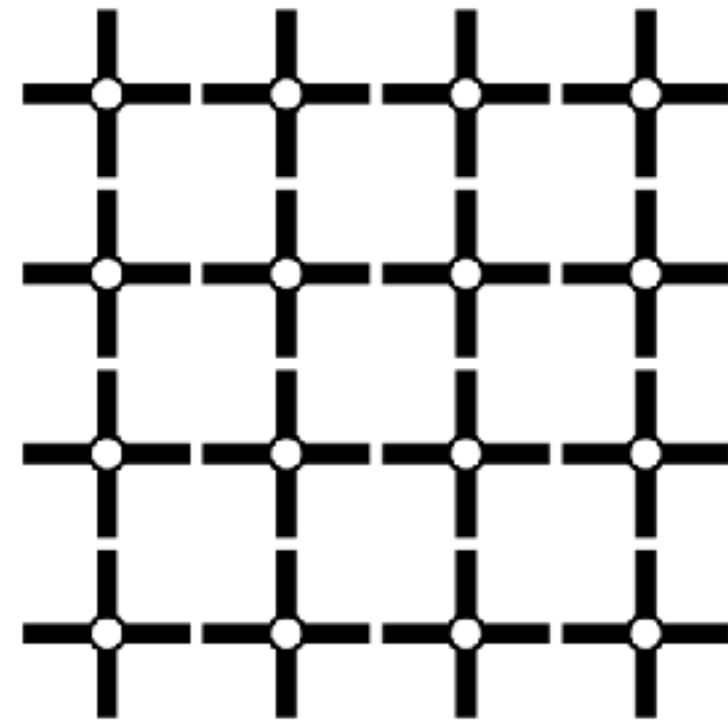


Extension Patterns (**Fractal₁**)

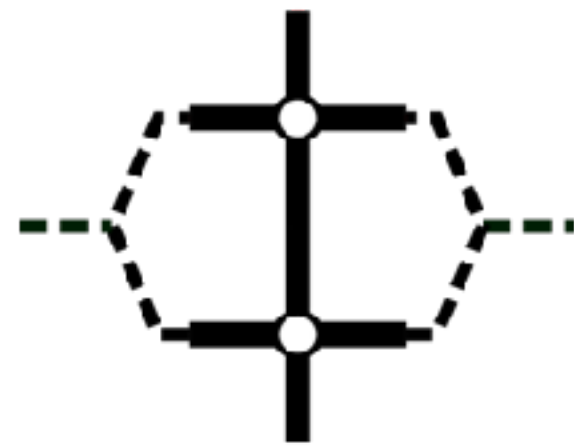
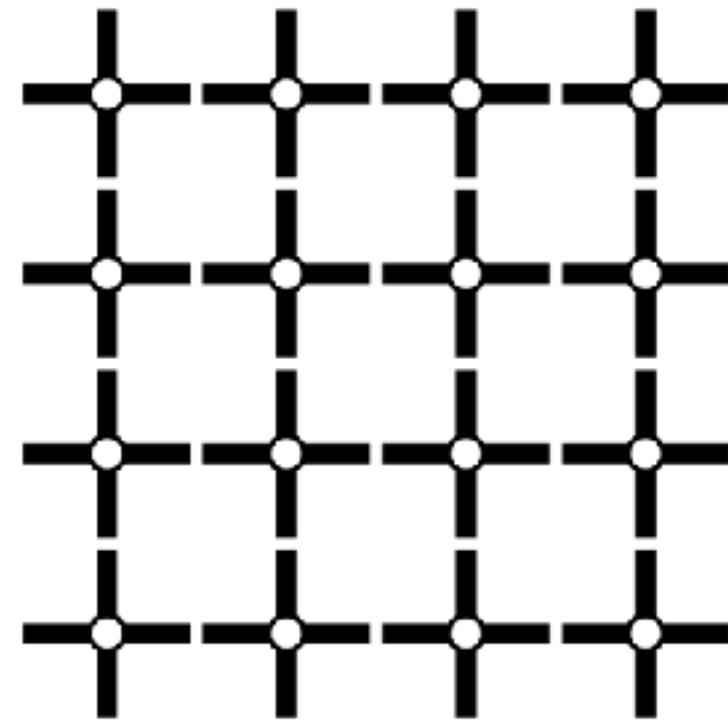


10 extension relations

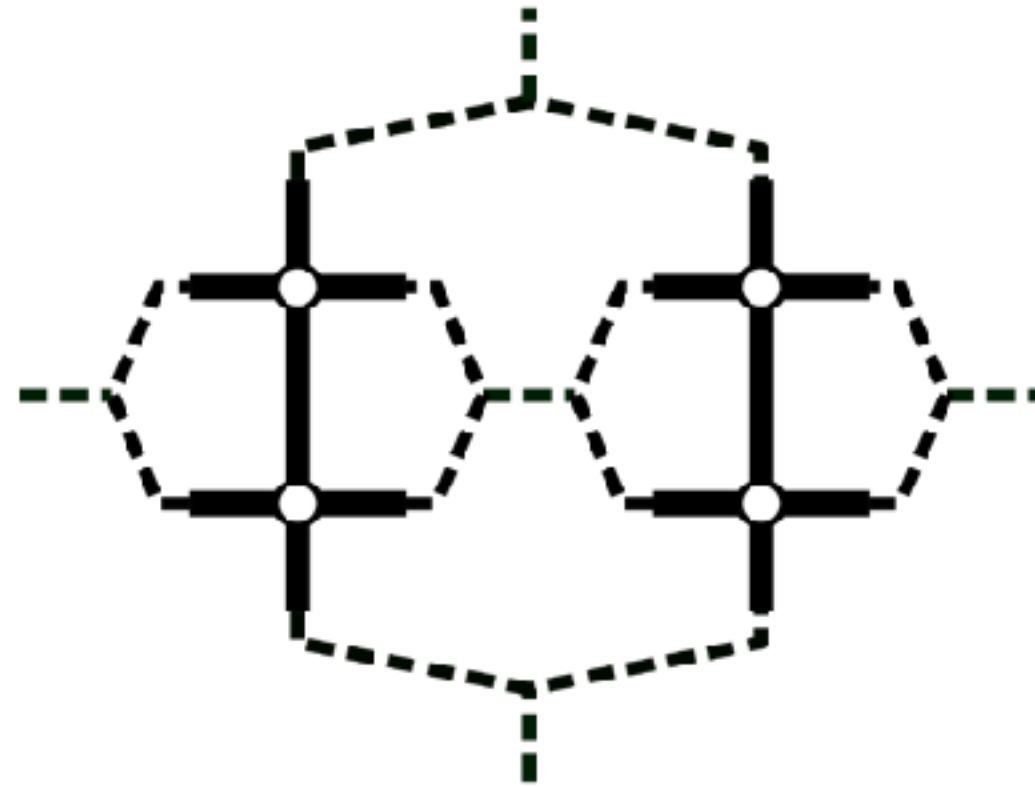
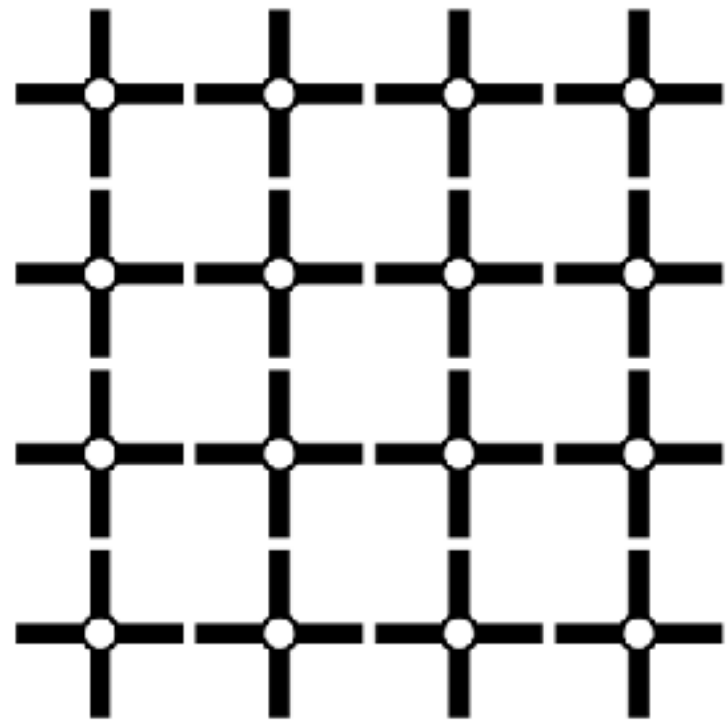
HOTRG: 4-Steps “Unrolling”



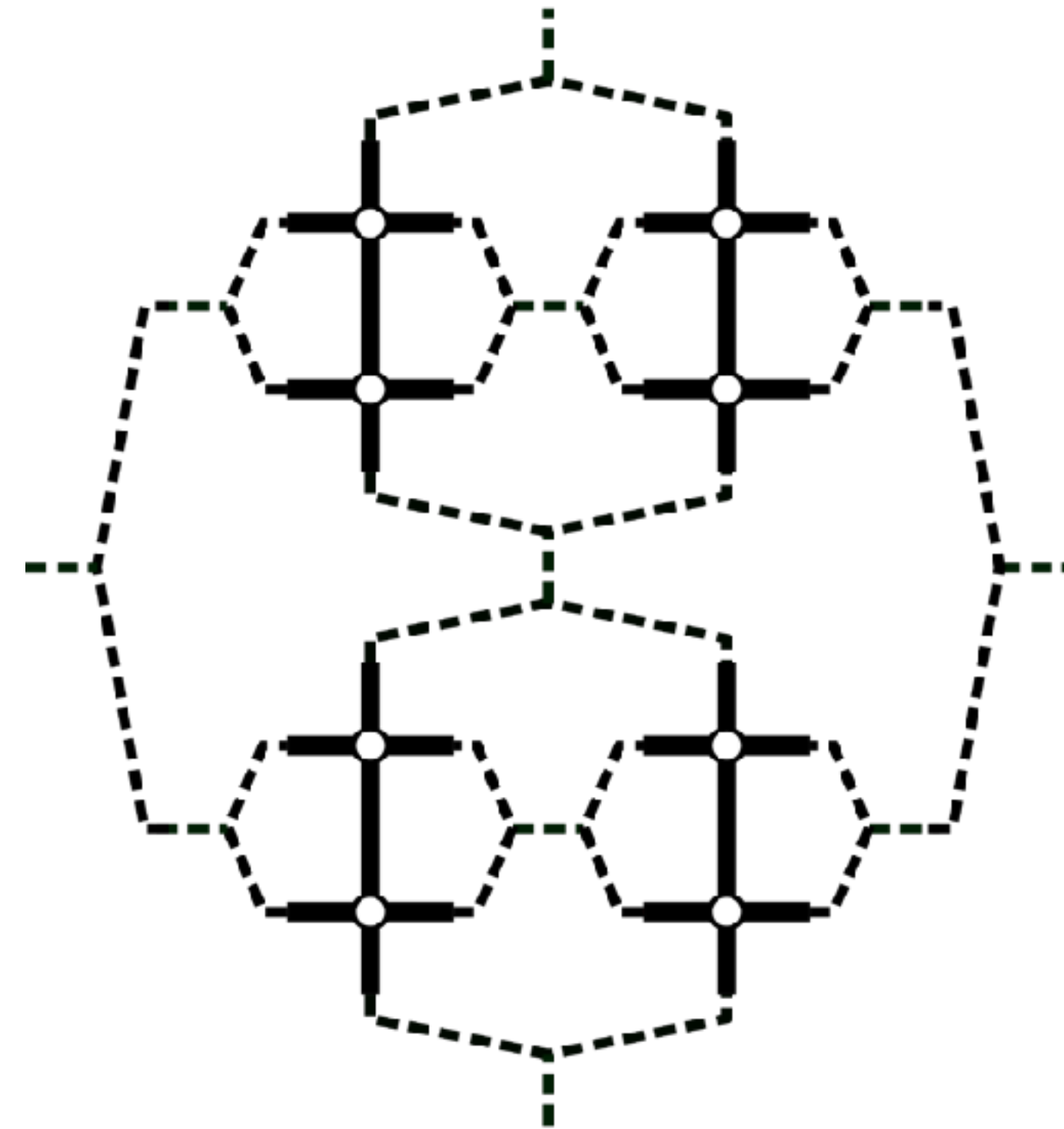
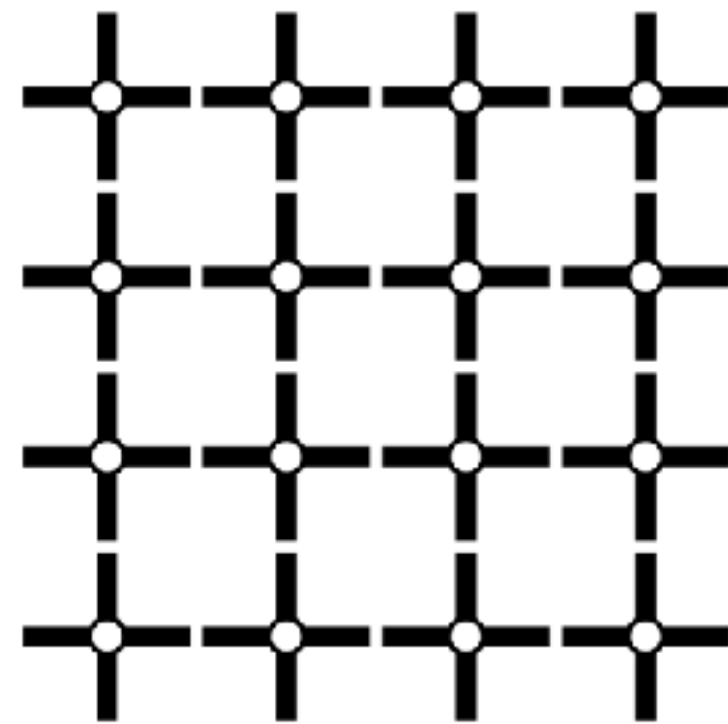
HOTRG: 4-Steps “Unrolling”



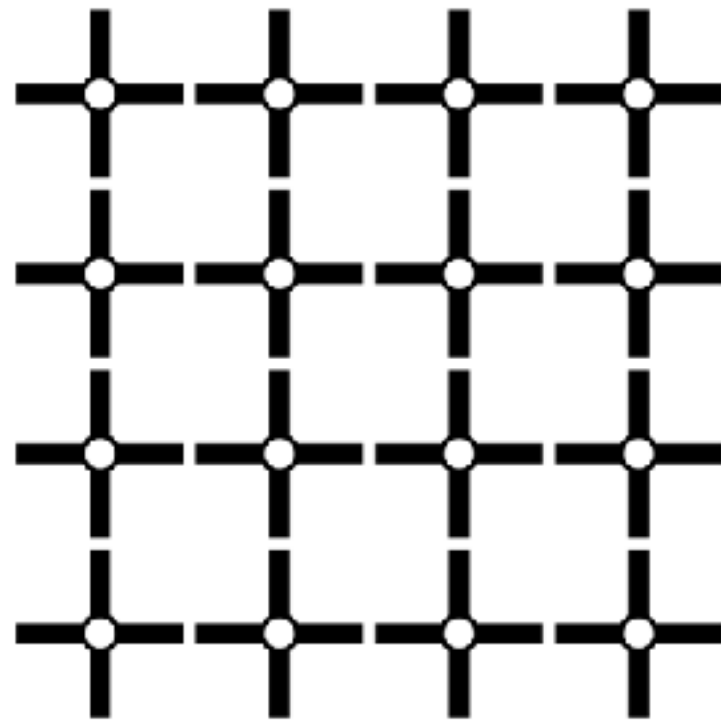
HOTRG: 4-Steps “Unrolling”



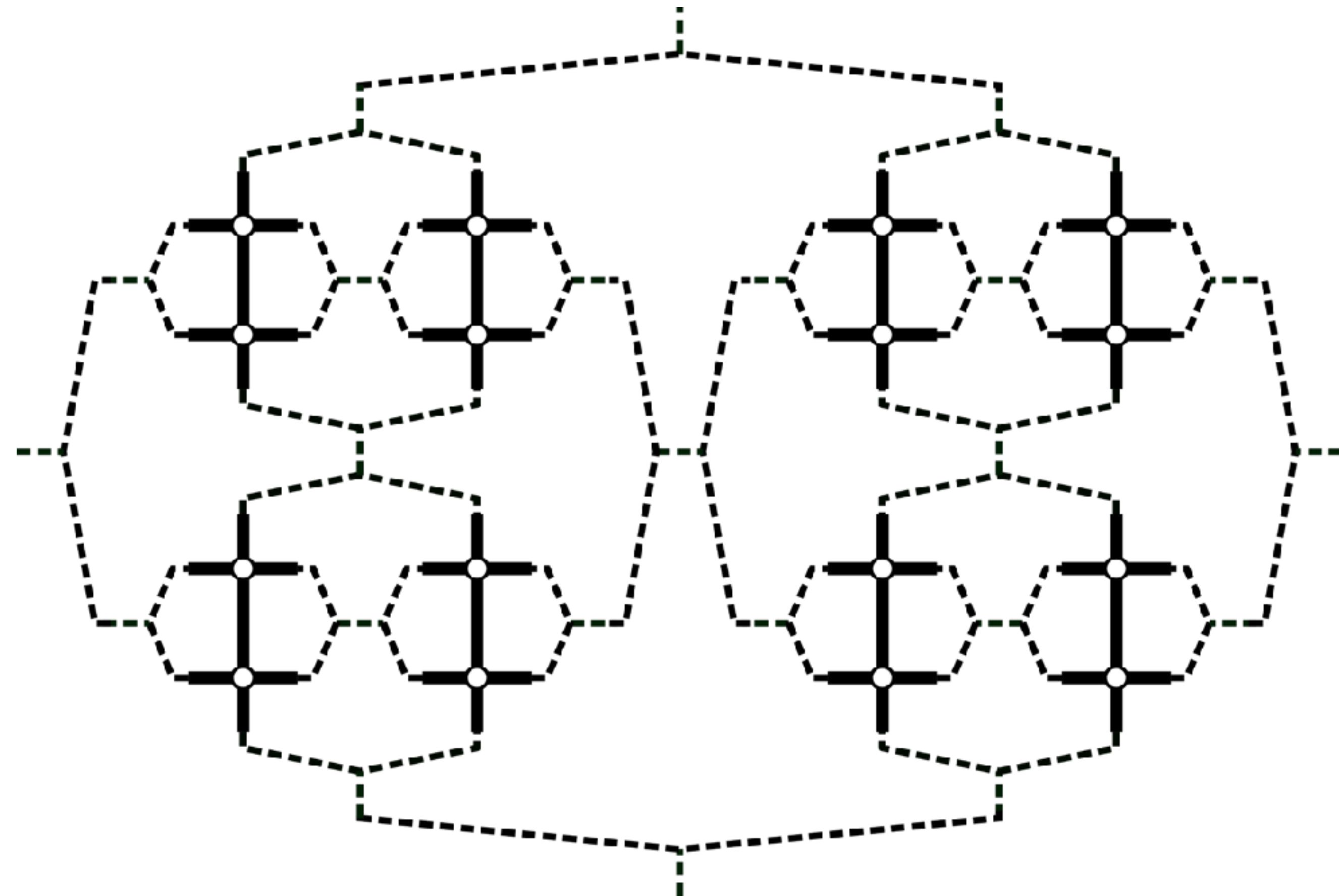
HOTRG: 4-Steps “Unrolling”



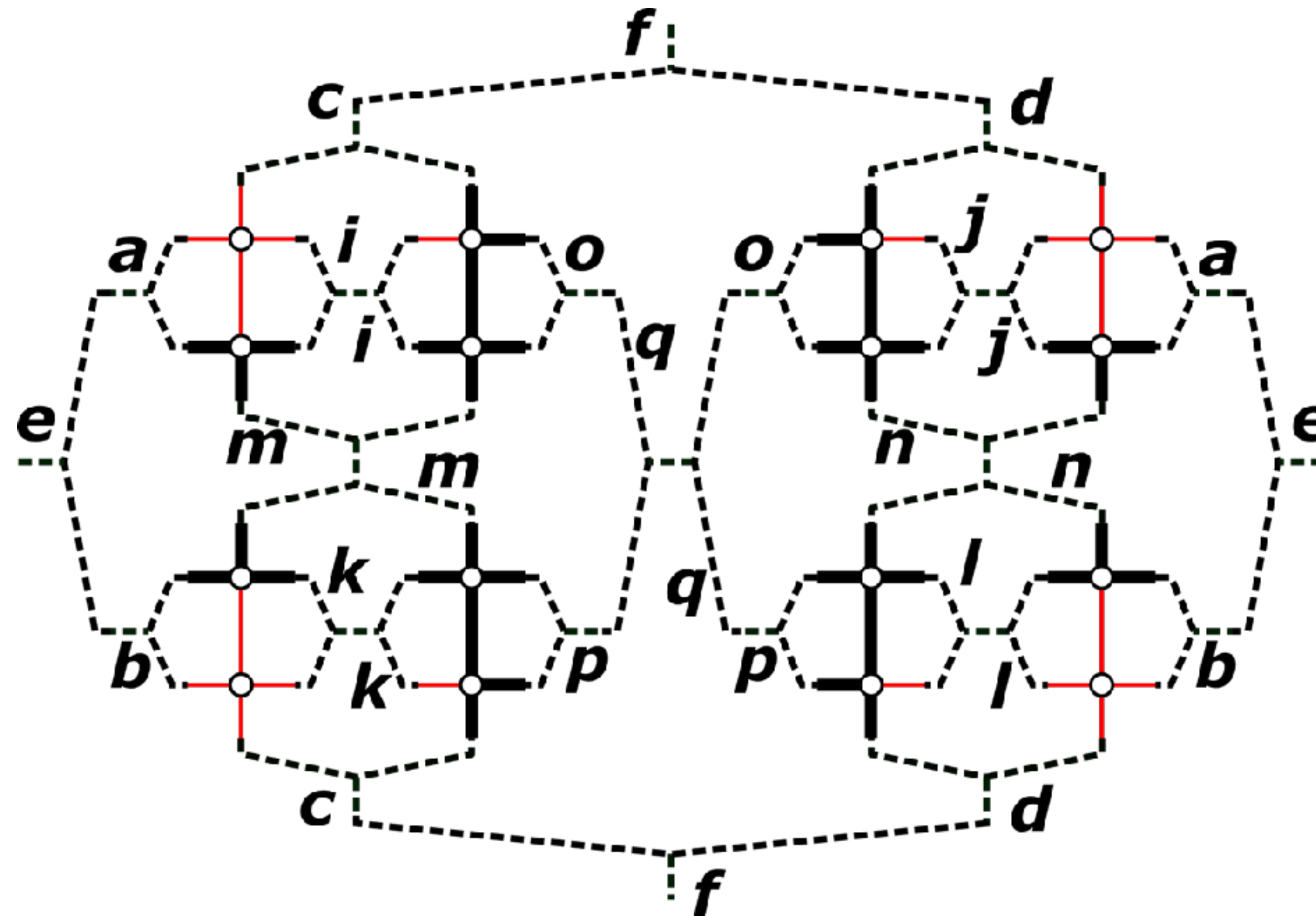
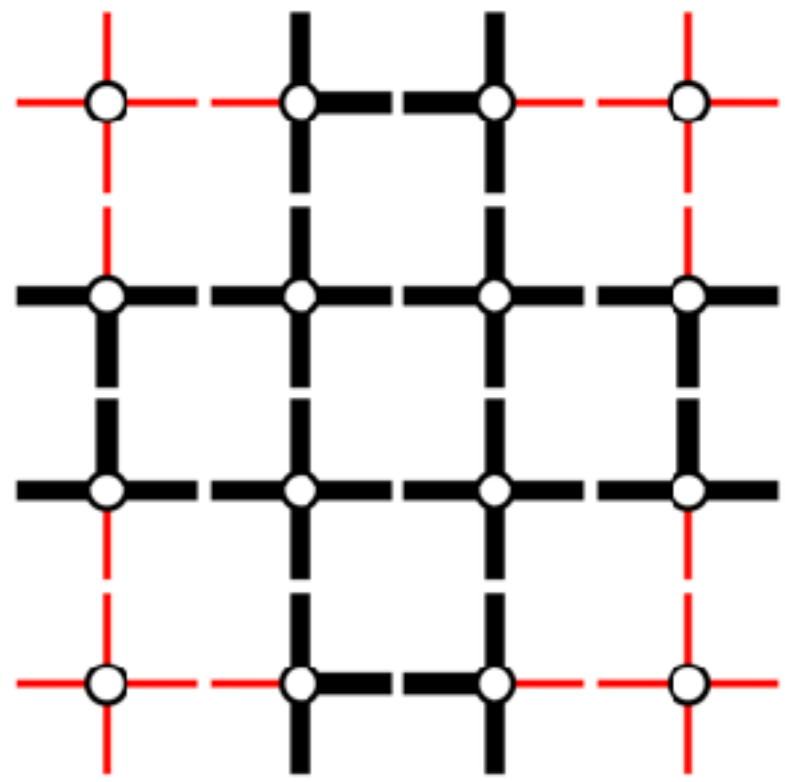
HOTRG: 4-Steps “Unrolling”



Notice which projectors are identical

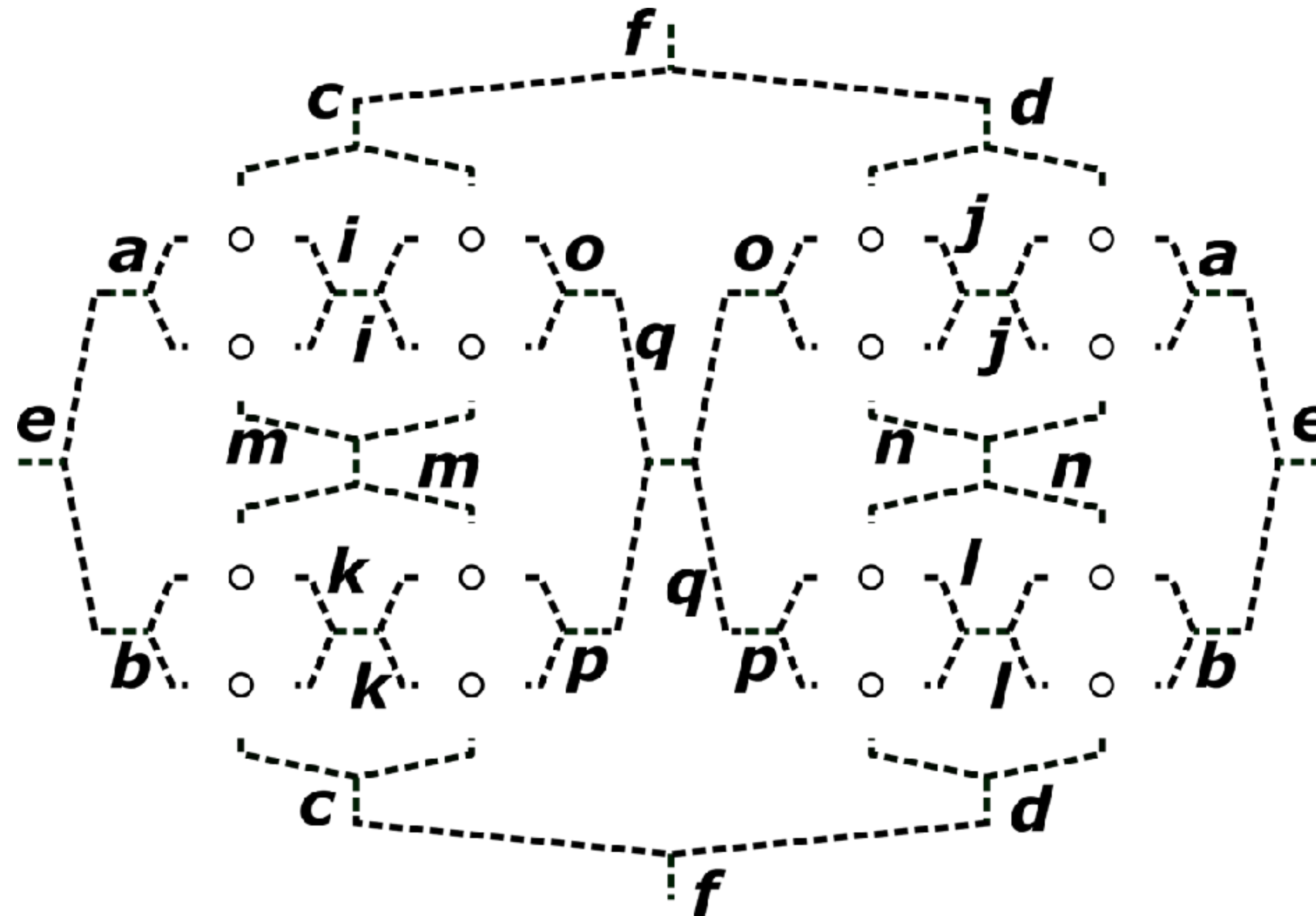
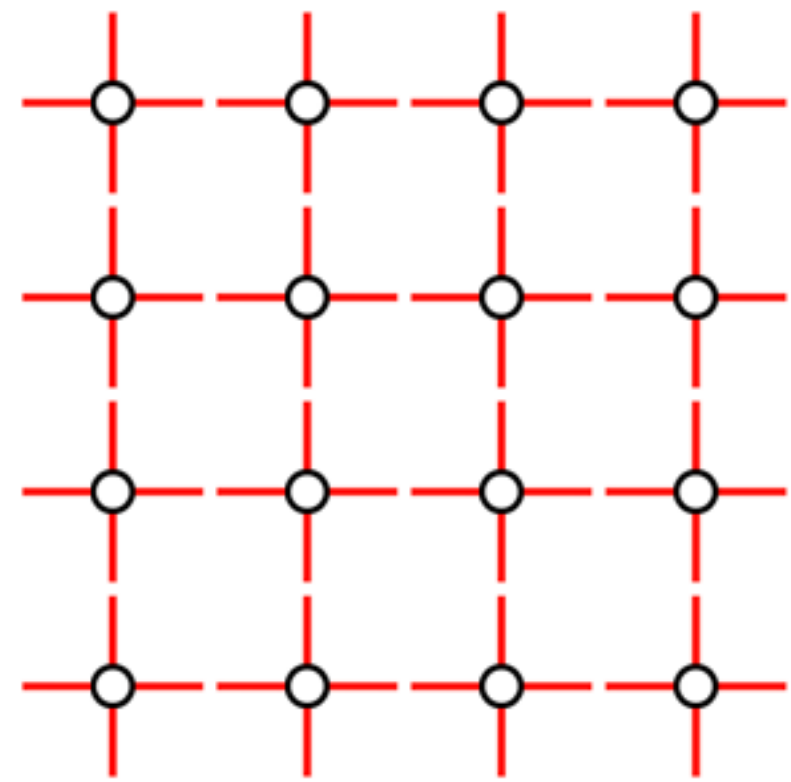


Inhomogeneous Projector Patterns



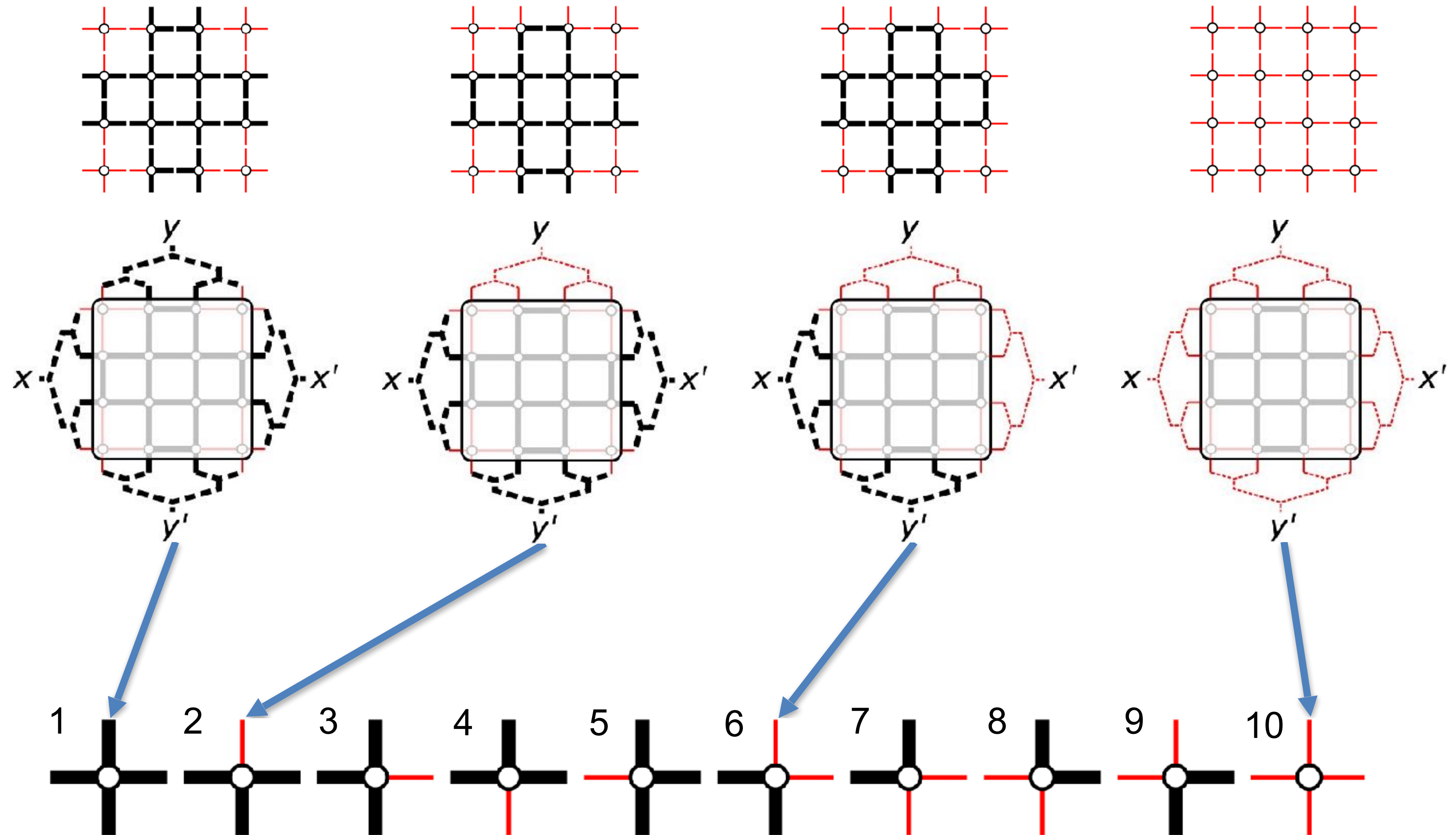
15 different projectors...

Inhomogeneous Projector Patterns



15 different projectors...

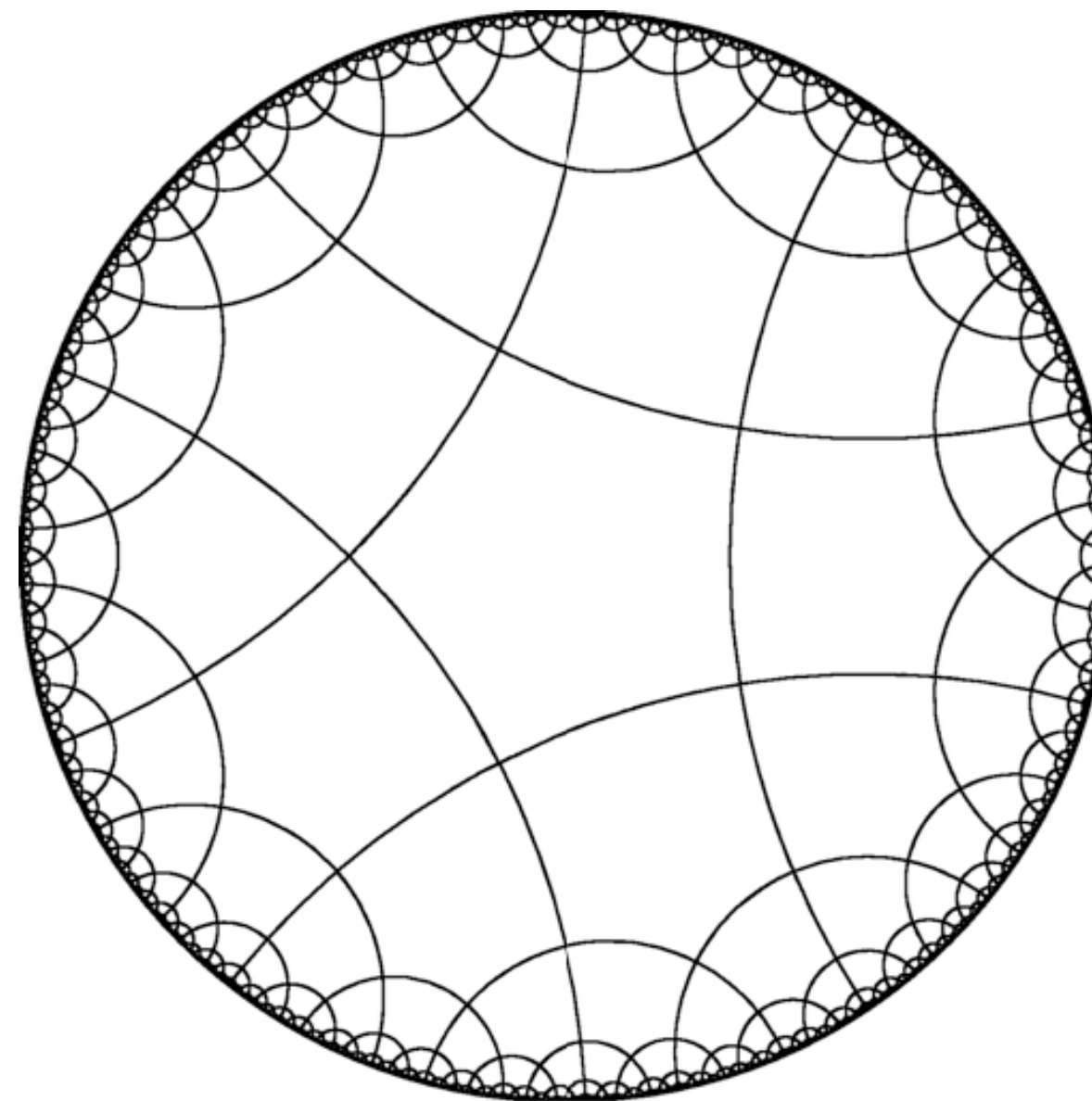
Projector Patterns: External Projectors



Part III

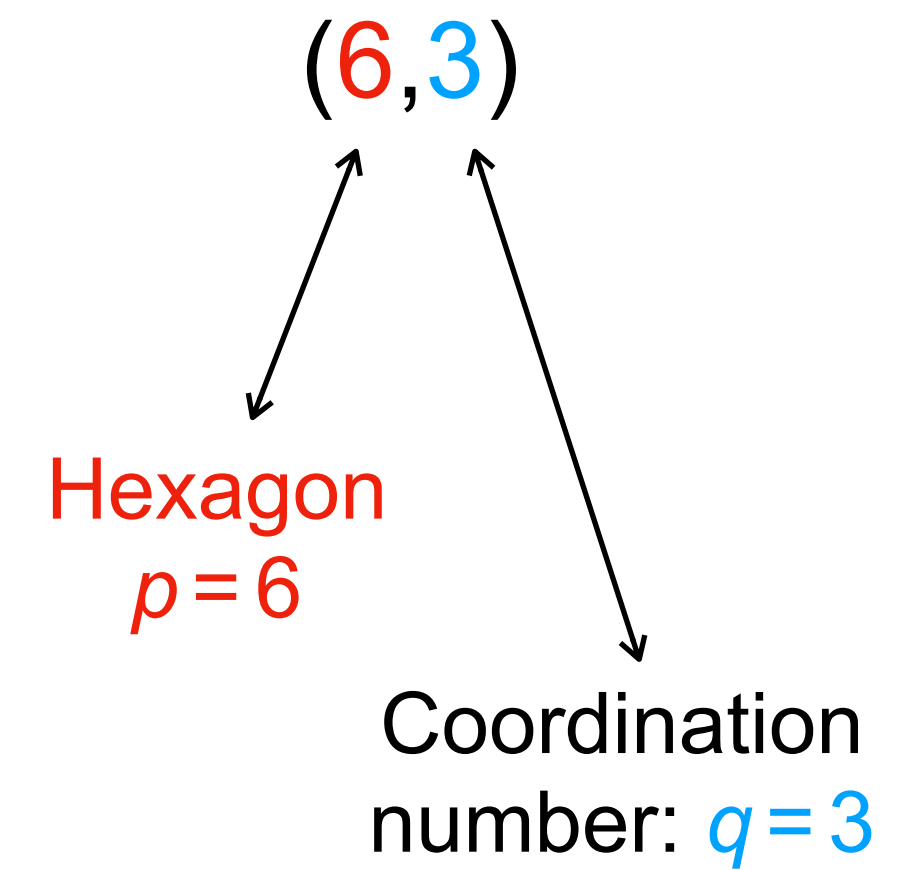
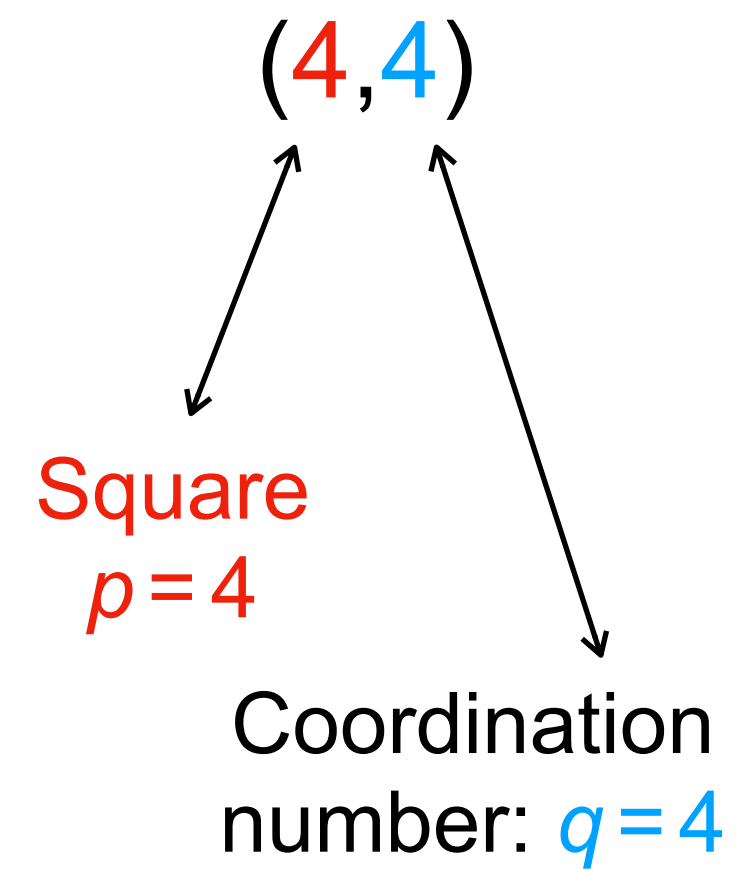
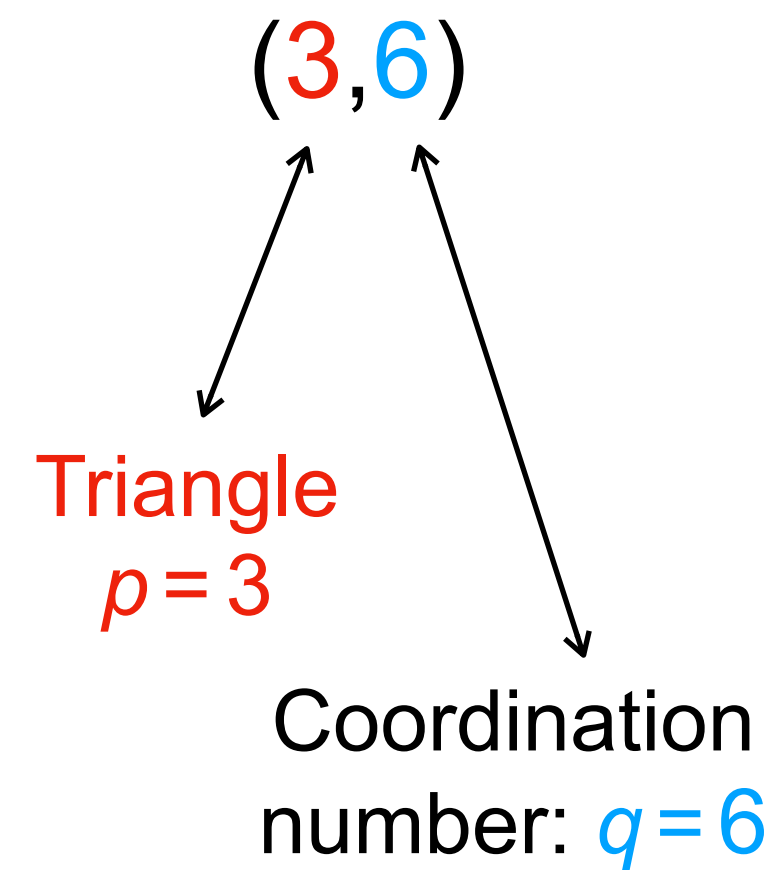
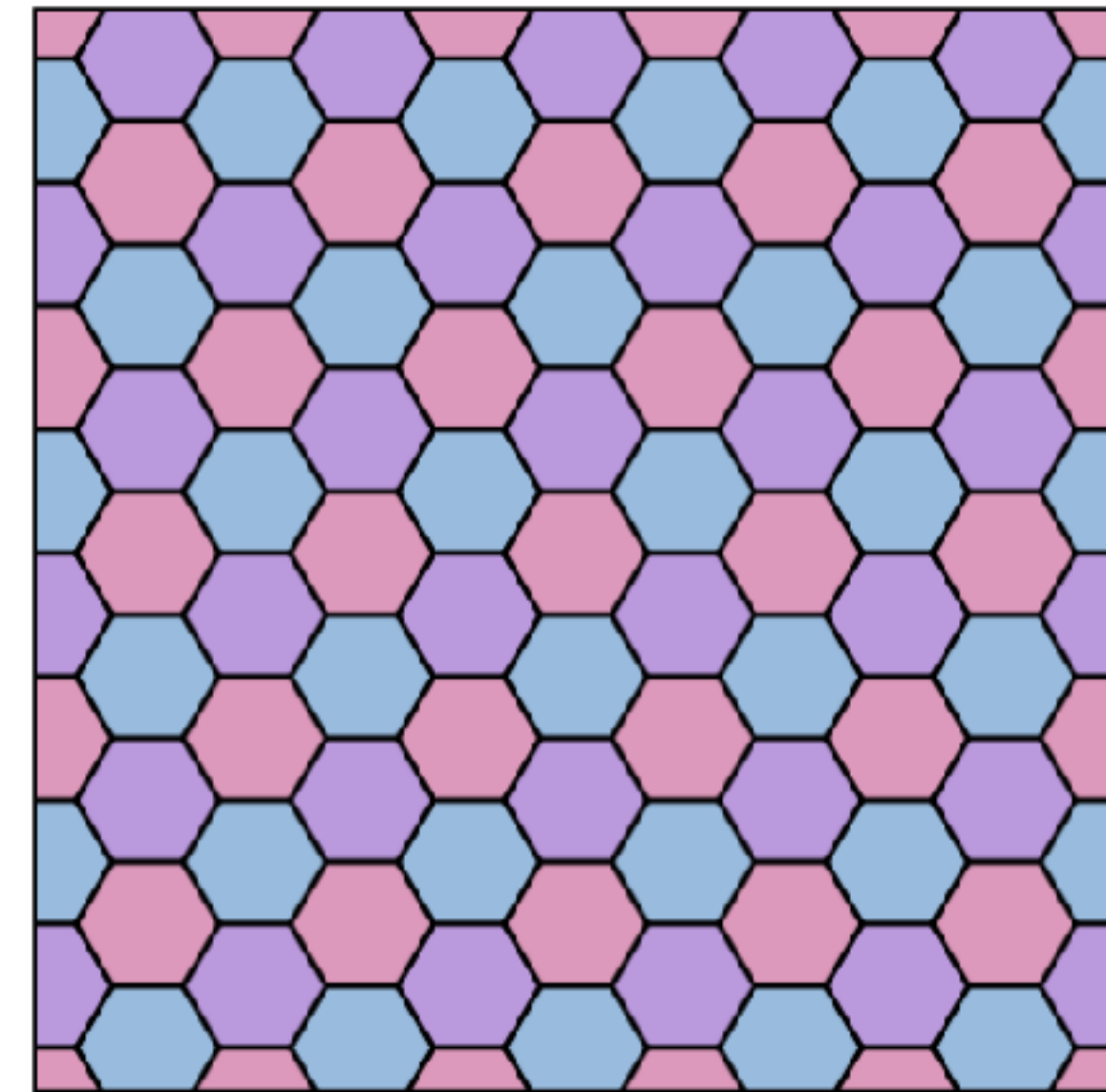
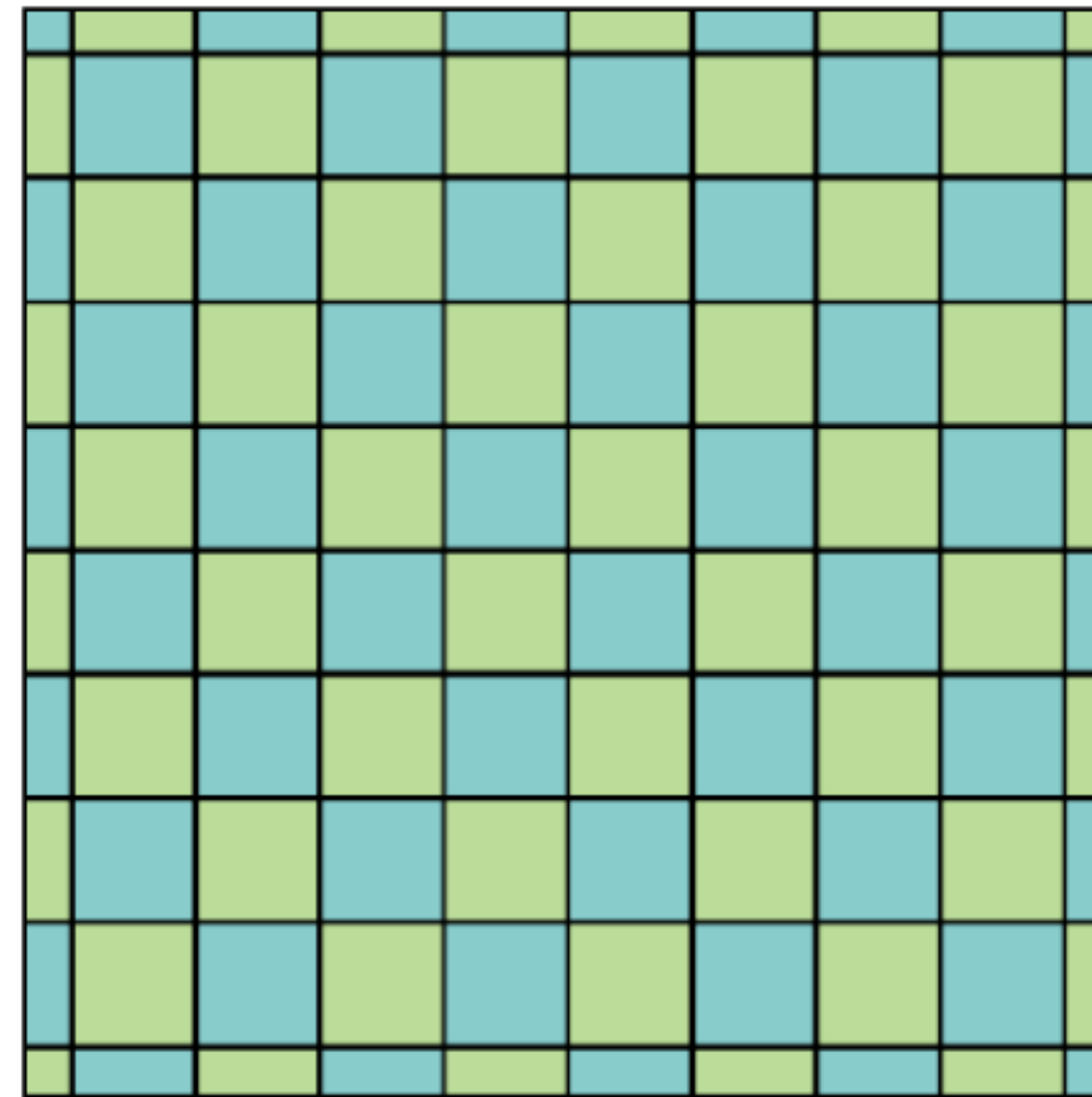
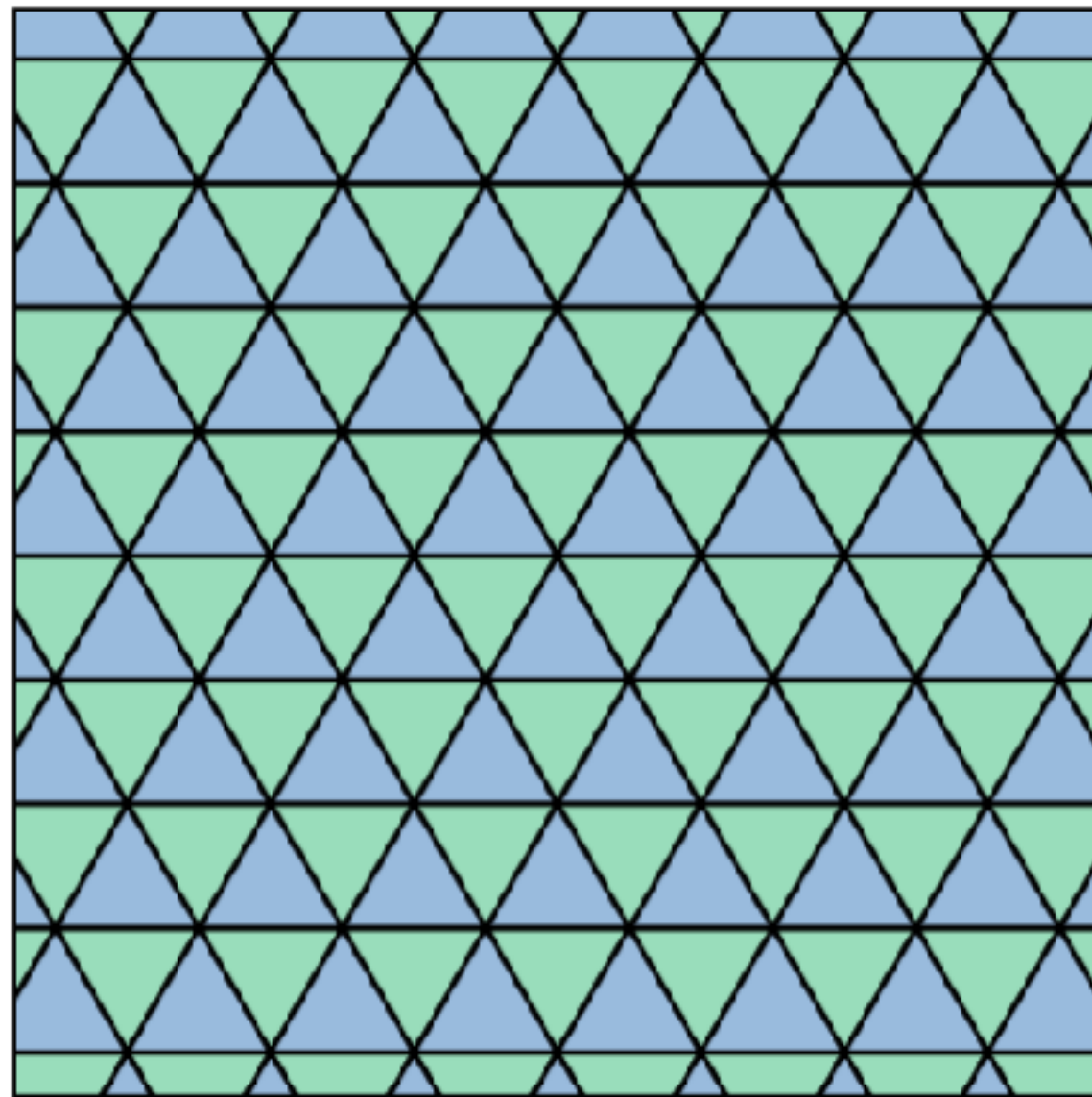
*Phase transitions on **hyperbolic** (anti-de Sitter) spaces*

1. Classification of the hyperbolic lattices
2. Analysis of classical/quantum spin models



Euclidean geometry: How to create a 2D plain using identical polygon tiling?

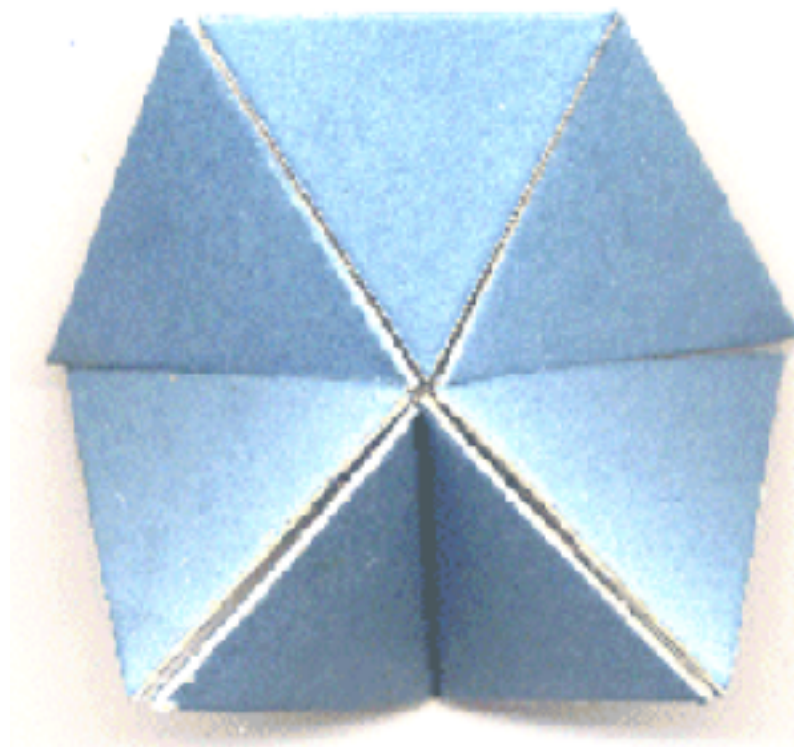
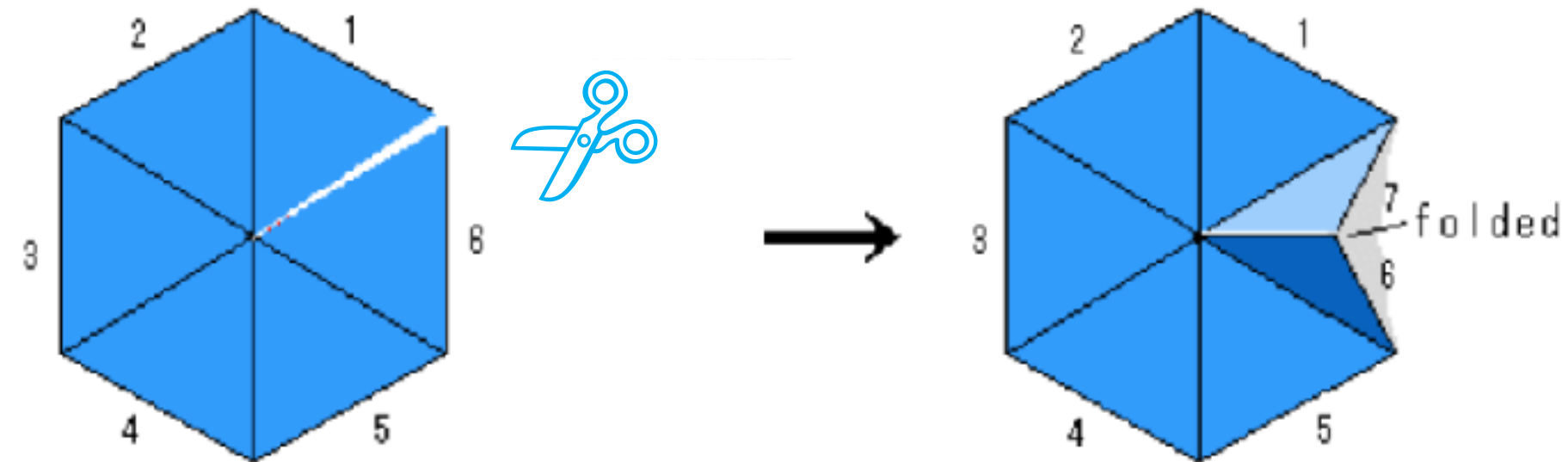
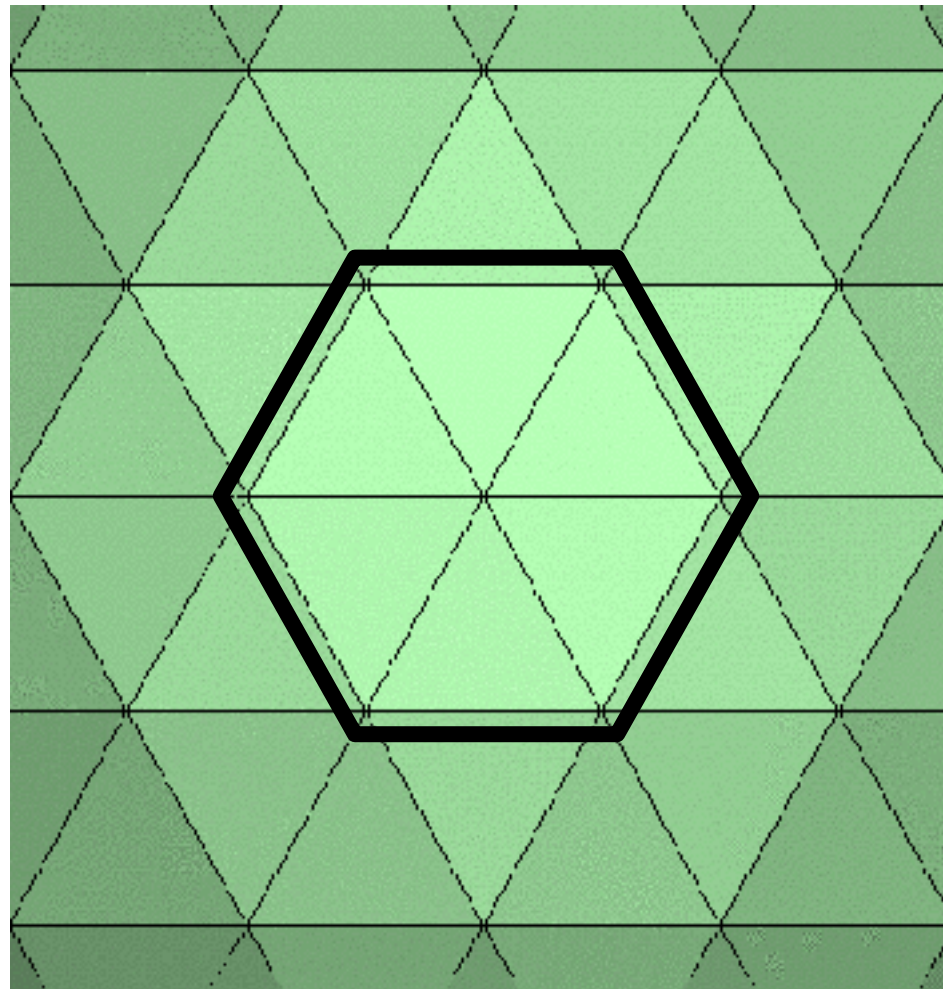
We consider a pair of two integers, known as Schläfli symbol (p, q)



How to **imagine** and **create** a hyperbolic surface using, e.g., triangular tessellations?

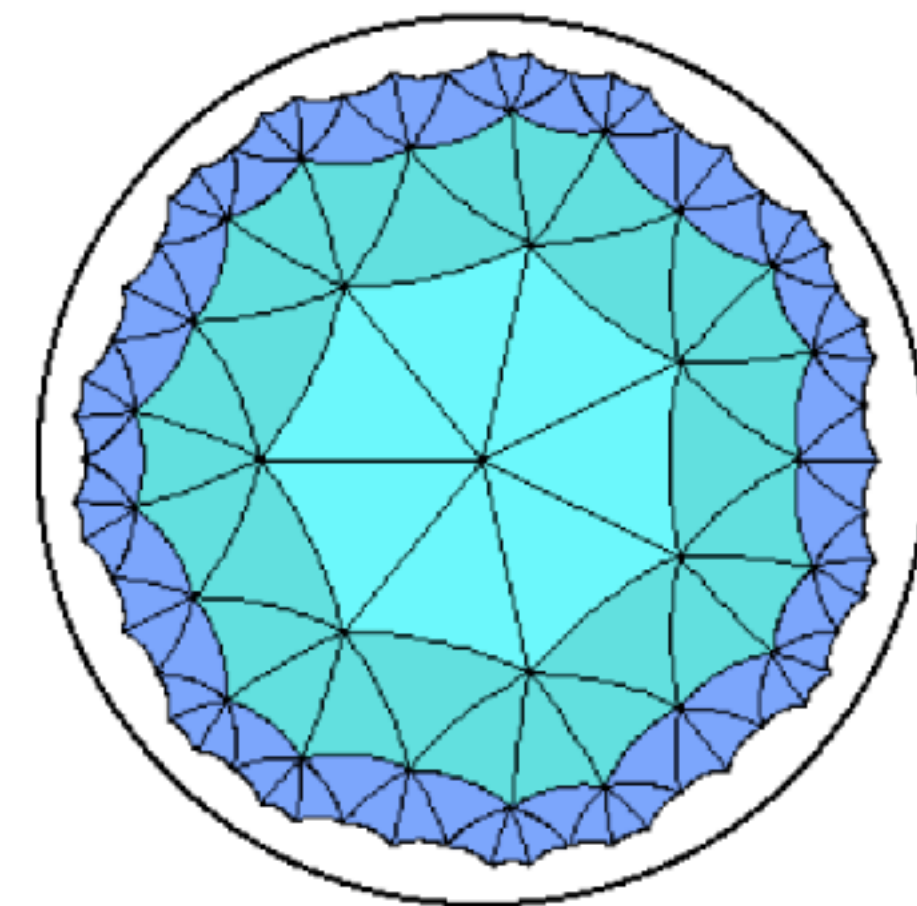
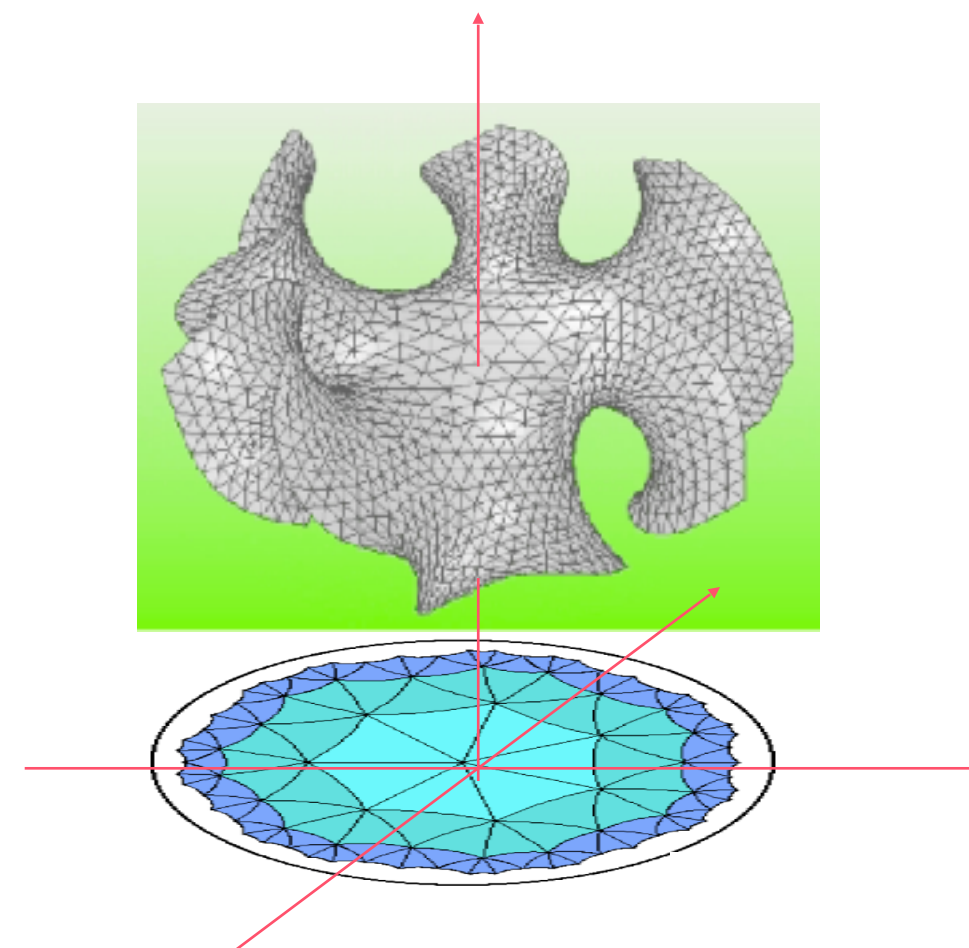
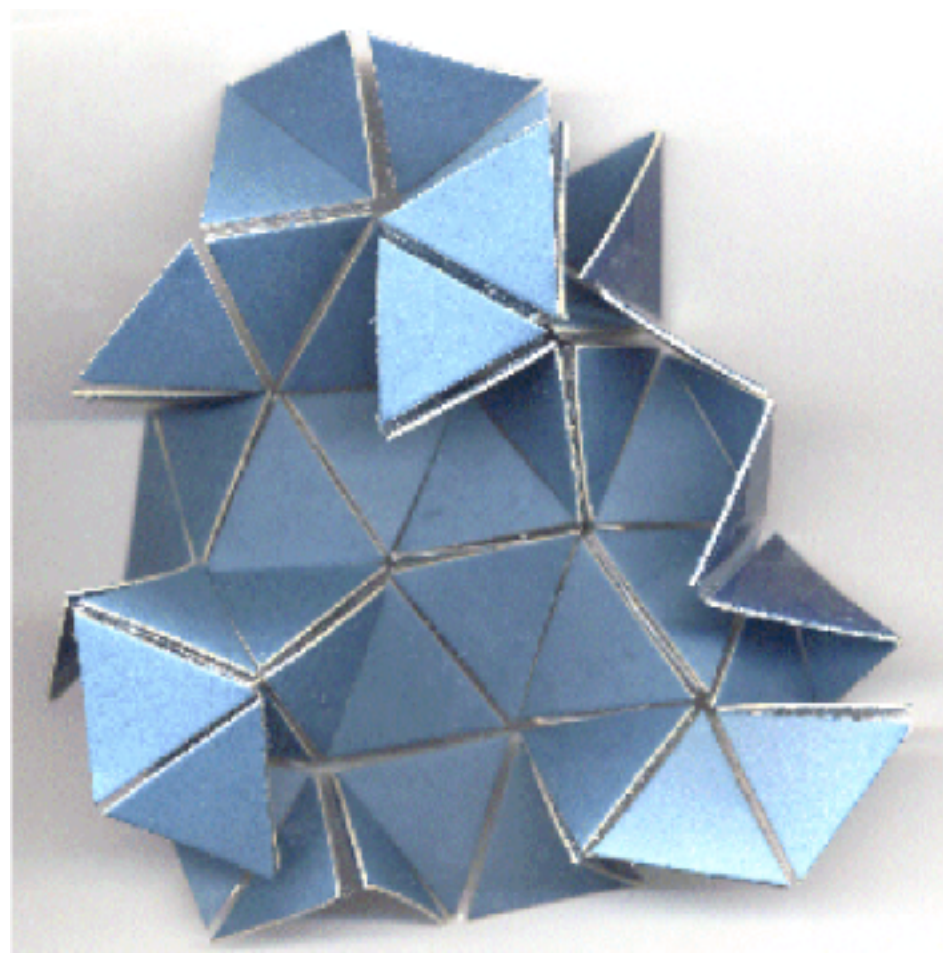
Aim: To construct a curved triangular surface (3,7)?

(Triangles, coord. #) = (3,6)



Poincaré disc
is a mapping of curved
surfaces onto a unit circle

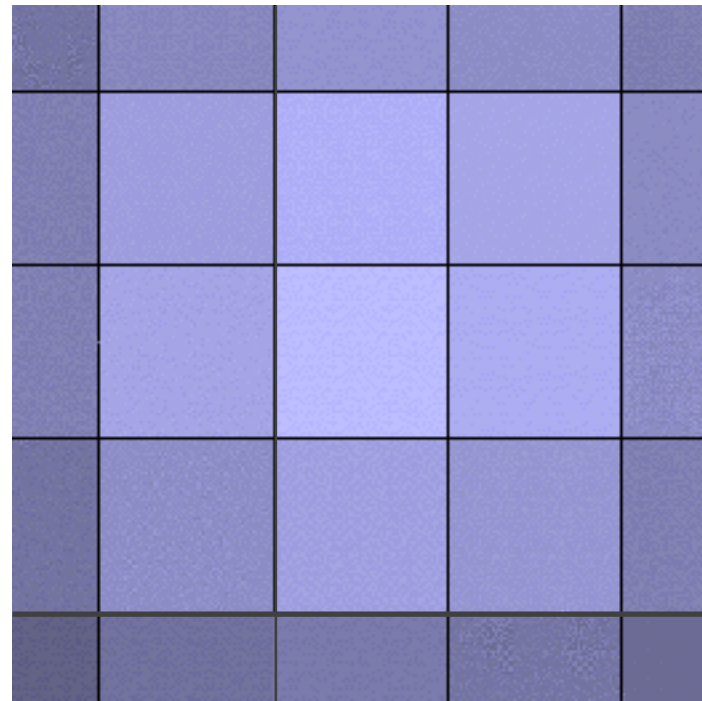
(Triangles, coord. #) = (3,7)



Poincaré disc
for (3,7)

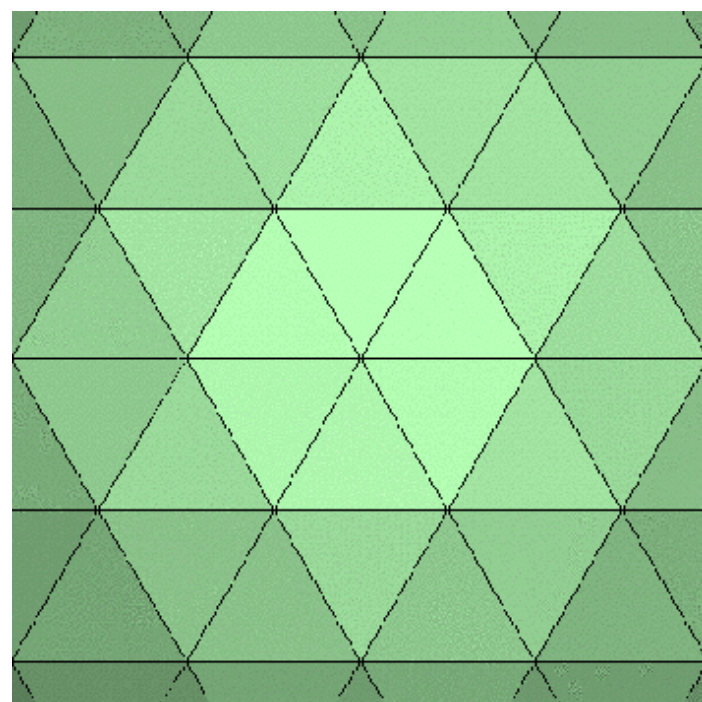
Schläfli symbol (p, q) denotes a regular p -gonal tiling with the coordination number q

Euclidean (flat)



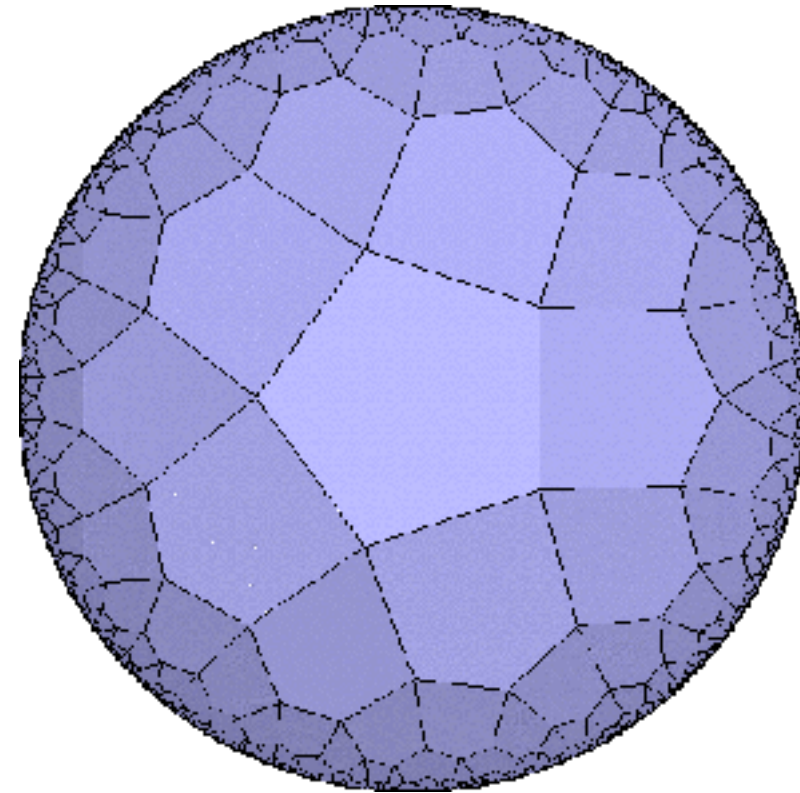
$(4,4)$

$$(p-2)(q-2) = 4$$

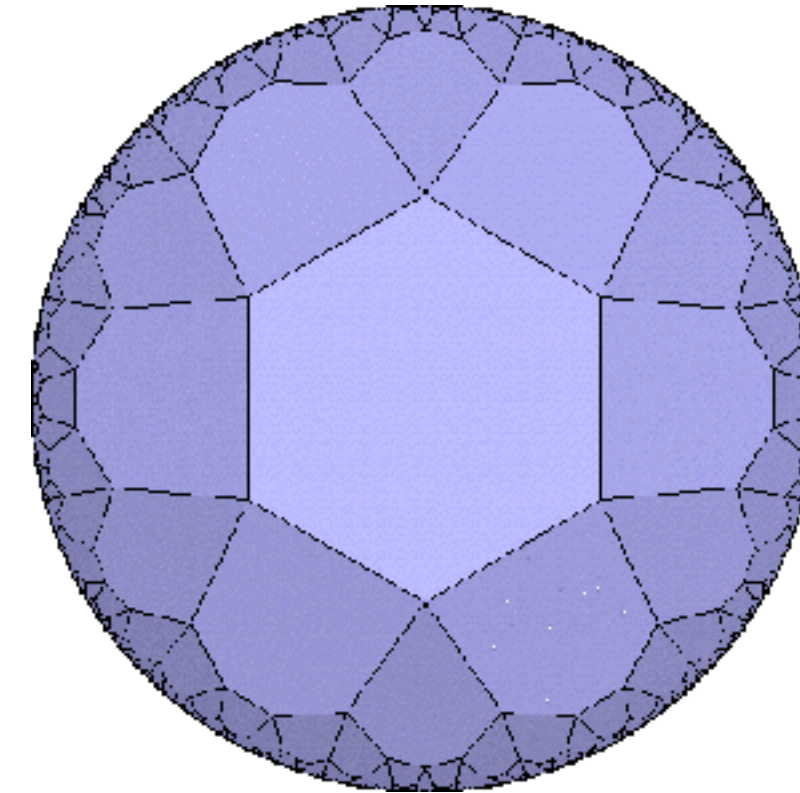


$(3,6)$

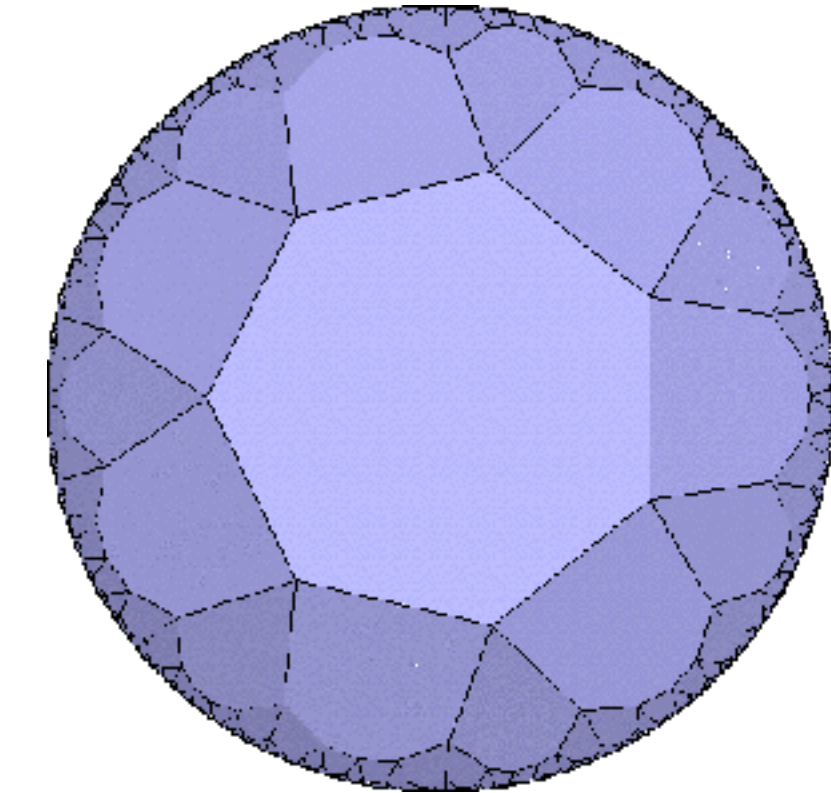
non-Euclidean (hyperbolic)



$(5,4)$

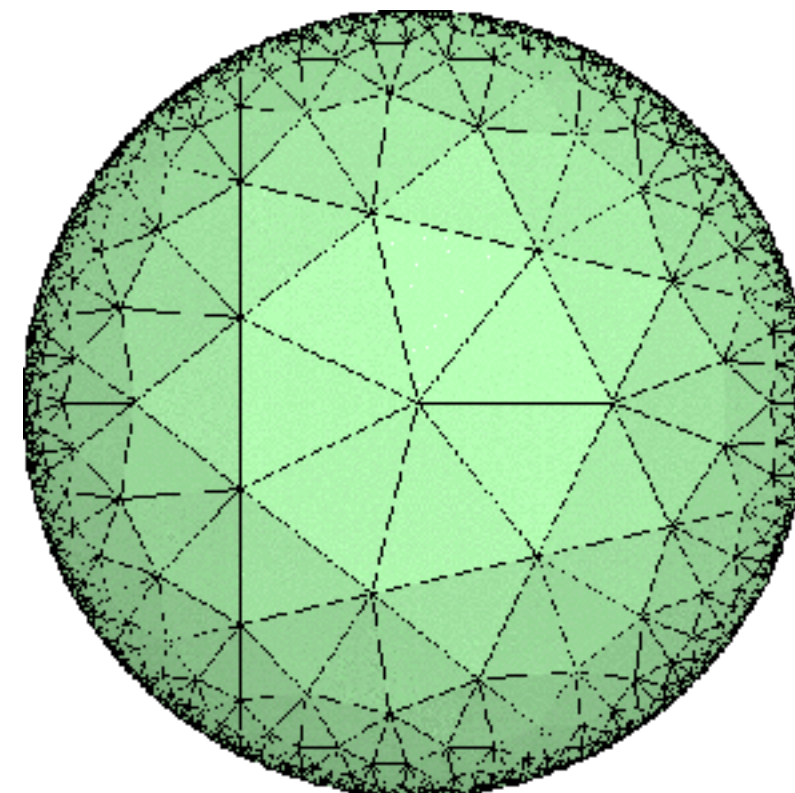


$(6,4)$

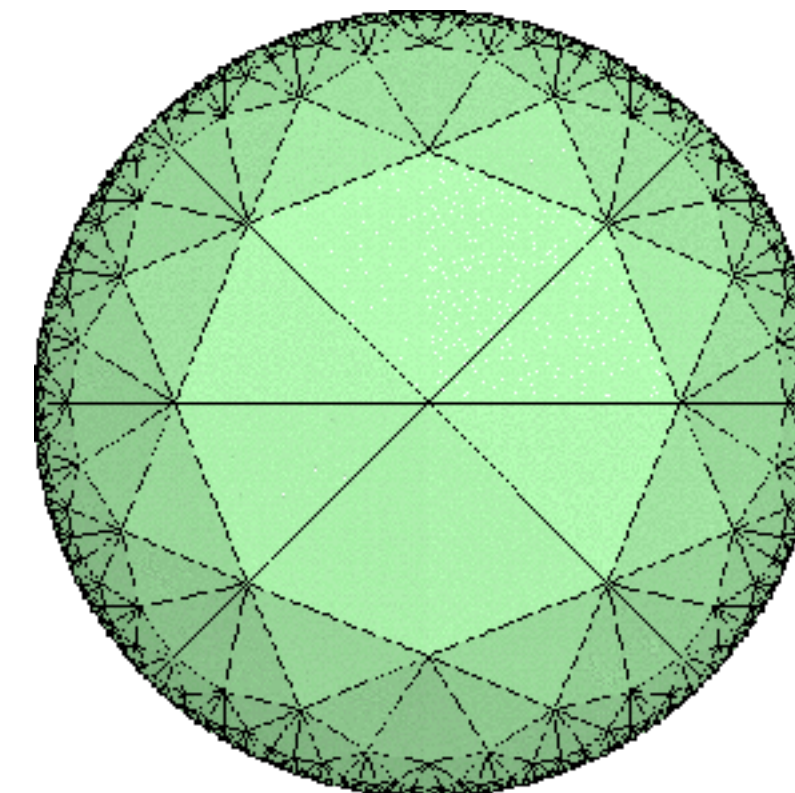


$(7,4) \dots$

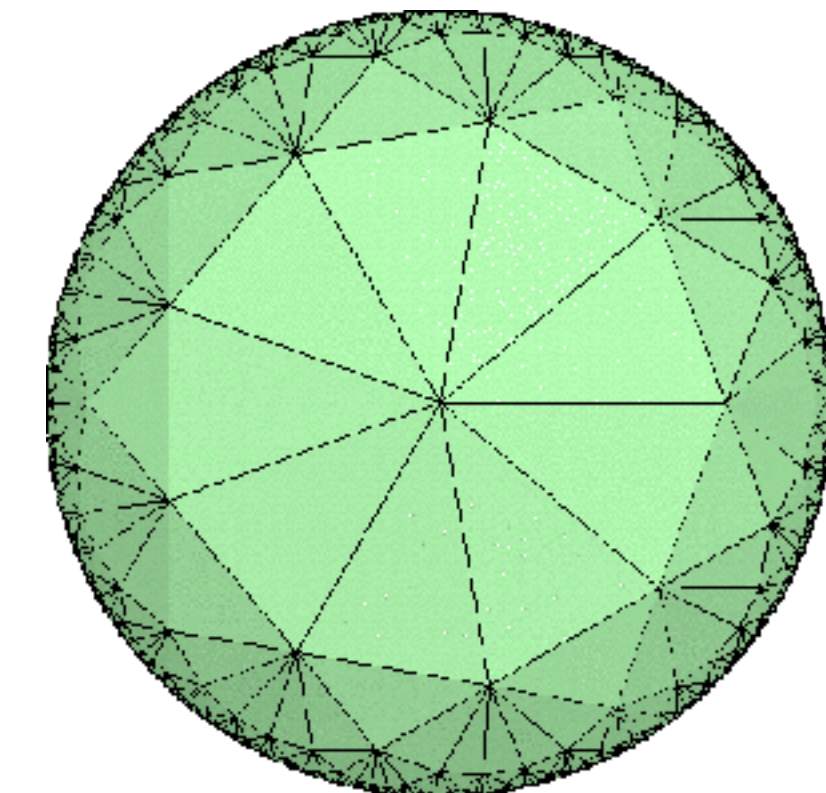
$$(p-2)(q-2) > 4$$



$(3,7)$



$(3,8)$



$(3,9) \dots$

The Hausdorff dimension d_H of all the hyperbolic lattices is ***infinite!***

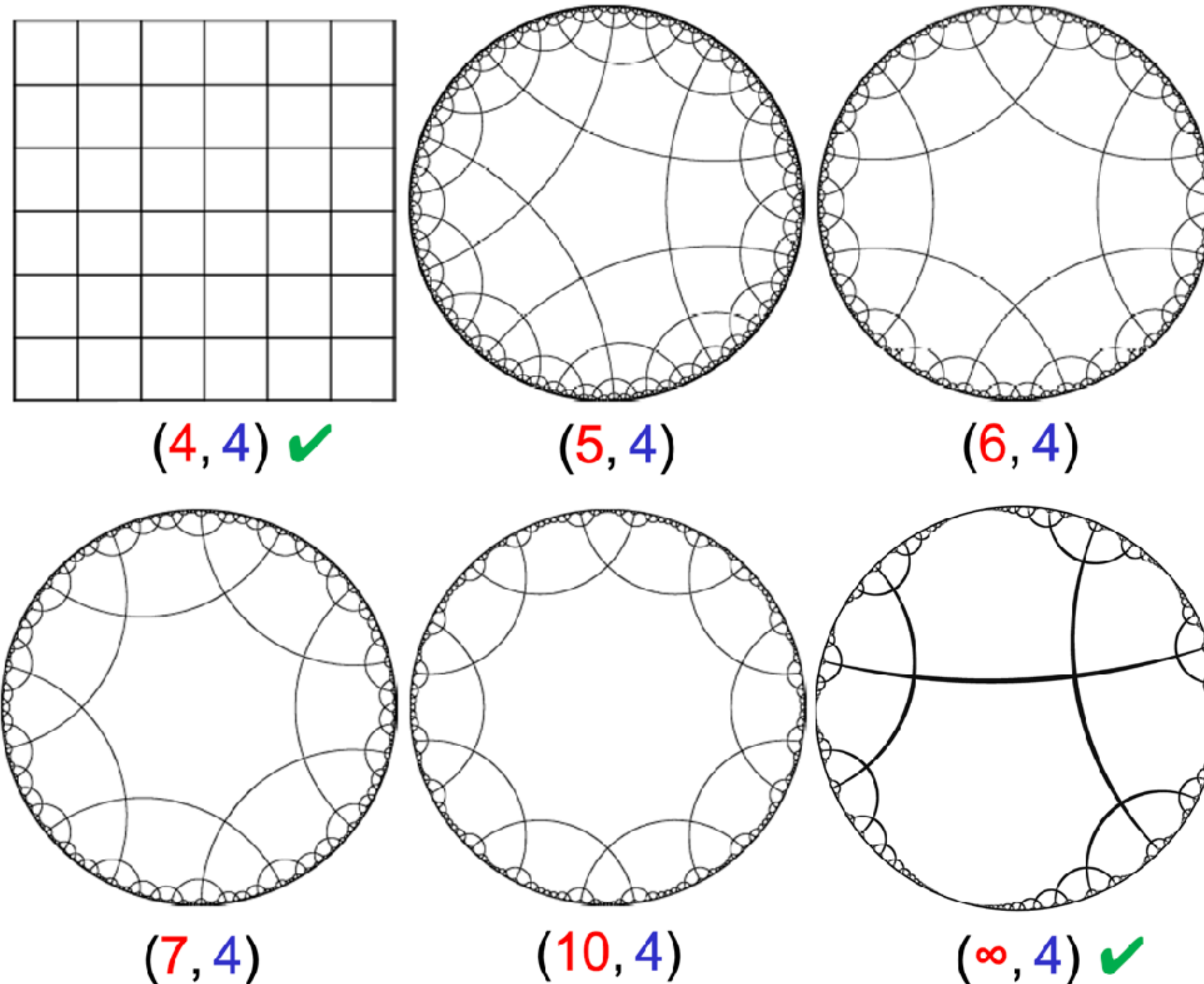
Classical spins on hyperbolic surfaces

Details of the algorithms are skipped.

How to assure that our Tensor Network is correct?

Let us check the phase transitions toward the Bethe lattice ($p \rightarrow \infty, 4$):

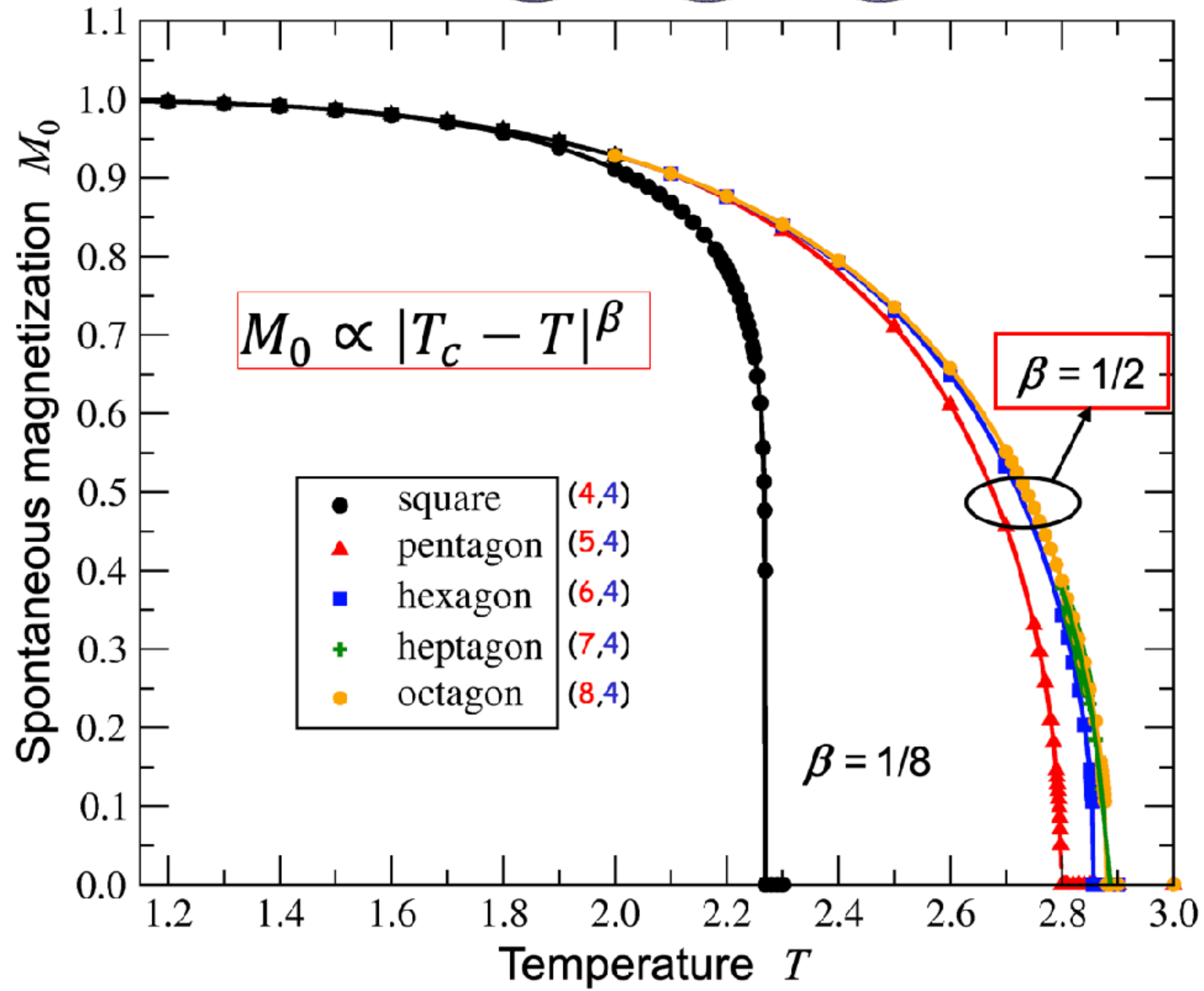
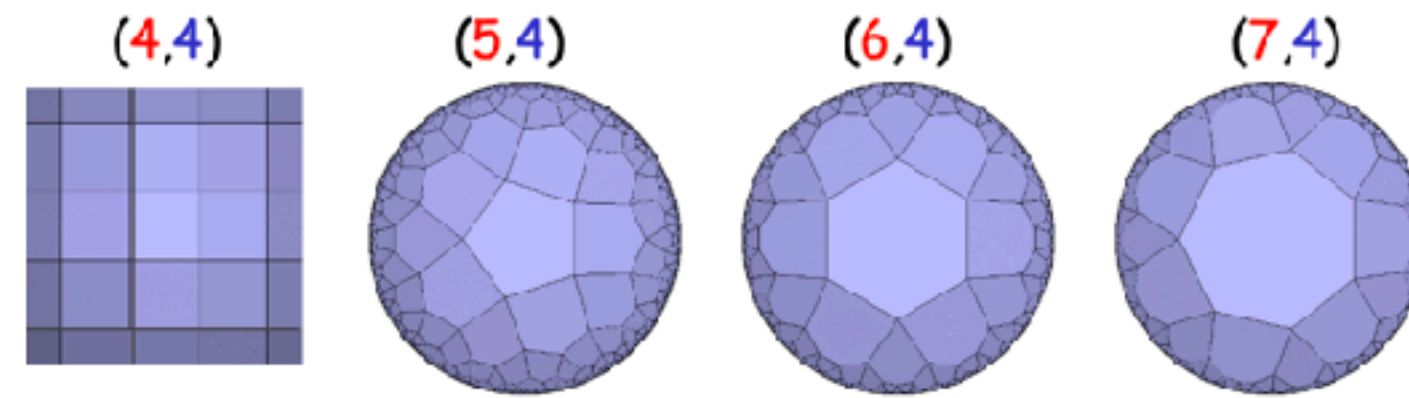
- We know the exact solutions on square $(4, 4)$ & Bethe $(\infty, 4)$ lattices for the classical Ising model



Magnetization for various p -gons at $q = 4$

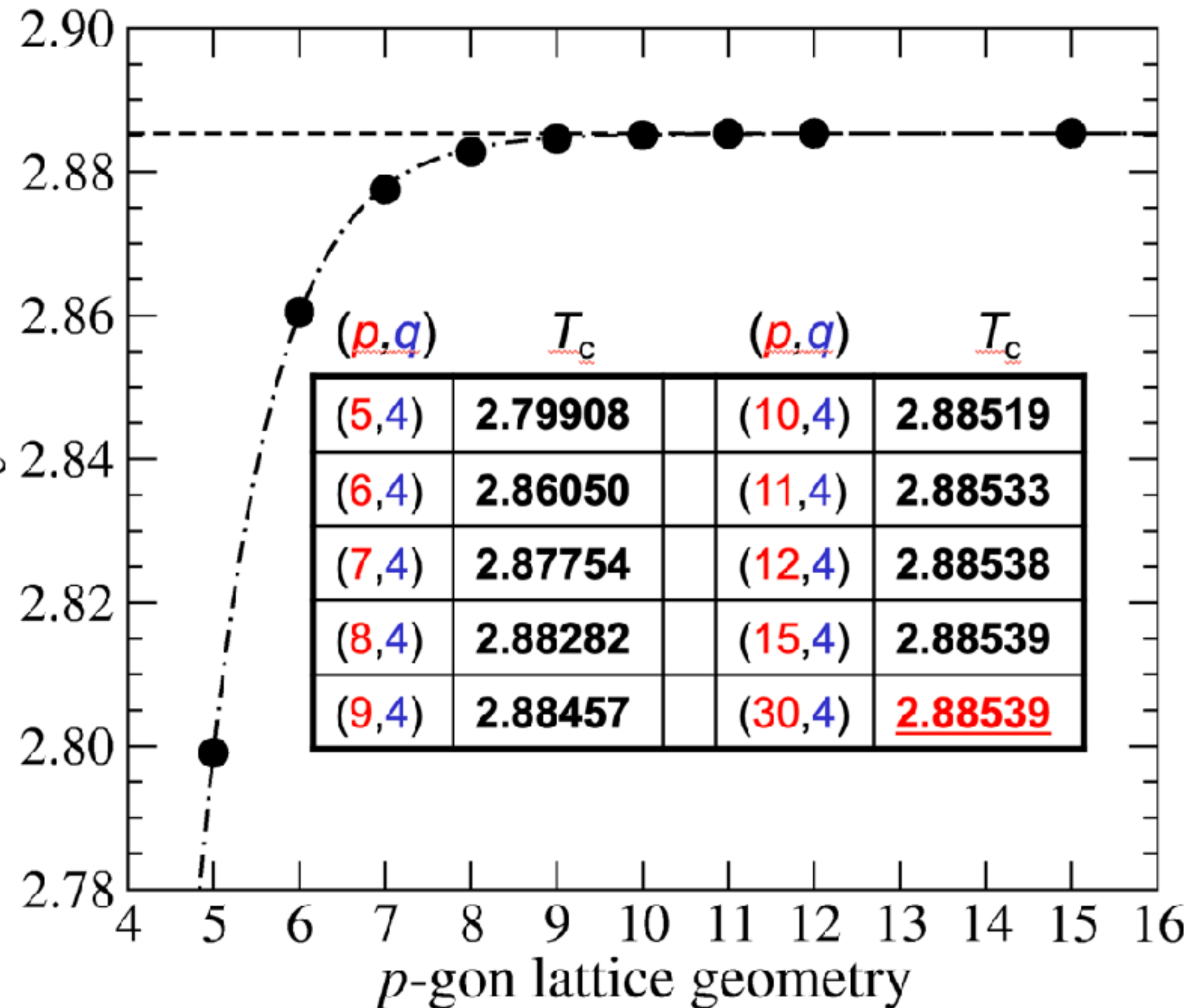
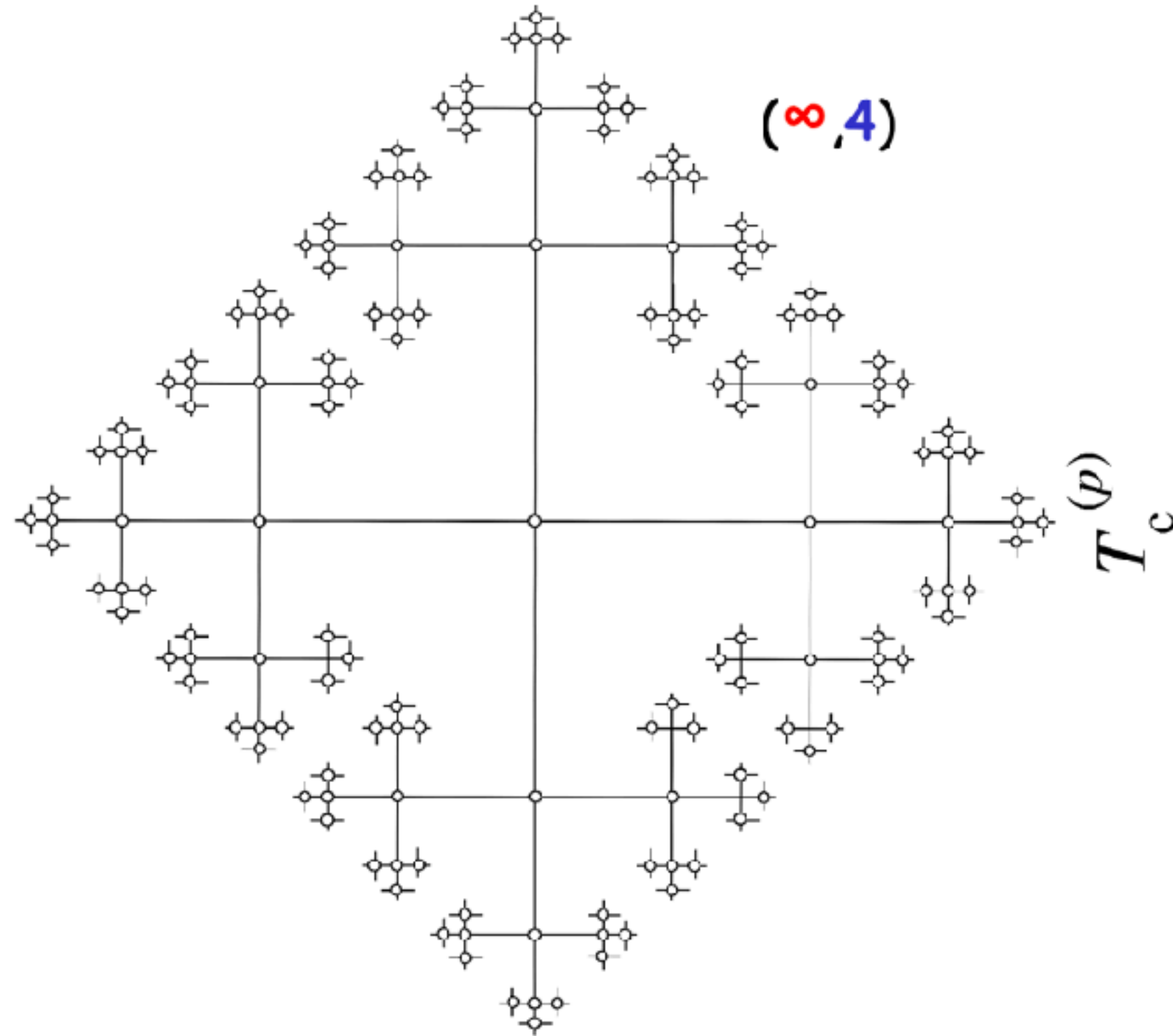
(Classical spin systems on hyperbolic geometry exhibit mean-field universality)

CTMRG study



The classical Ising model on $(p,4)$ lattices by CTMRG

Phase transition: T_c versus p

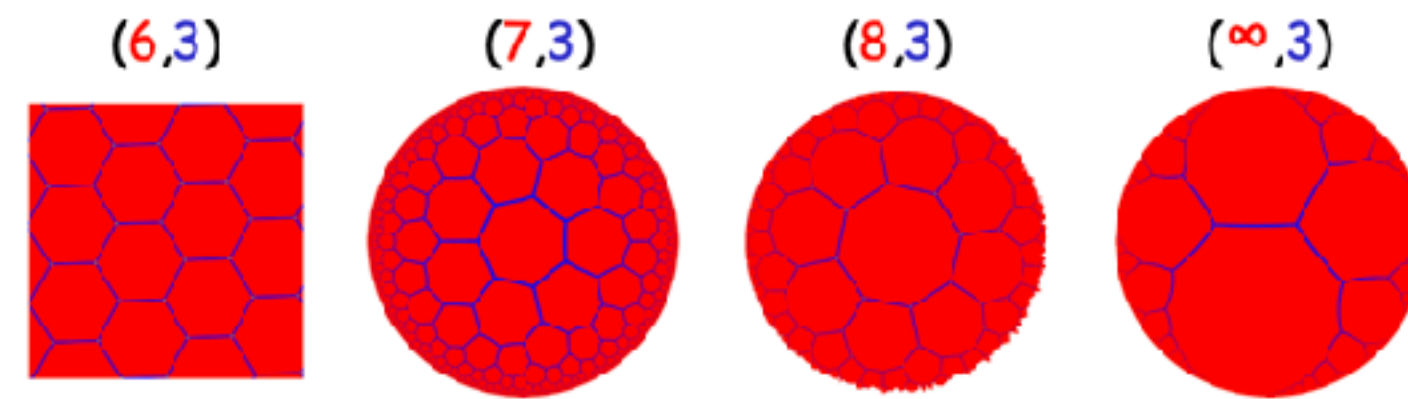


The classical Ising model on the **Bethe lattice** $(\infty,4)$ is exactly solvable with the critical temperature $T_c = 2 / \ln 2 = \underline{\underline{2.88539008\dots}}$

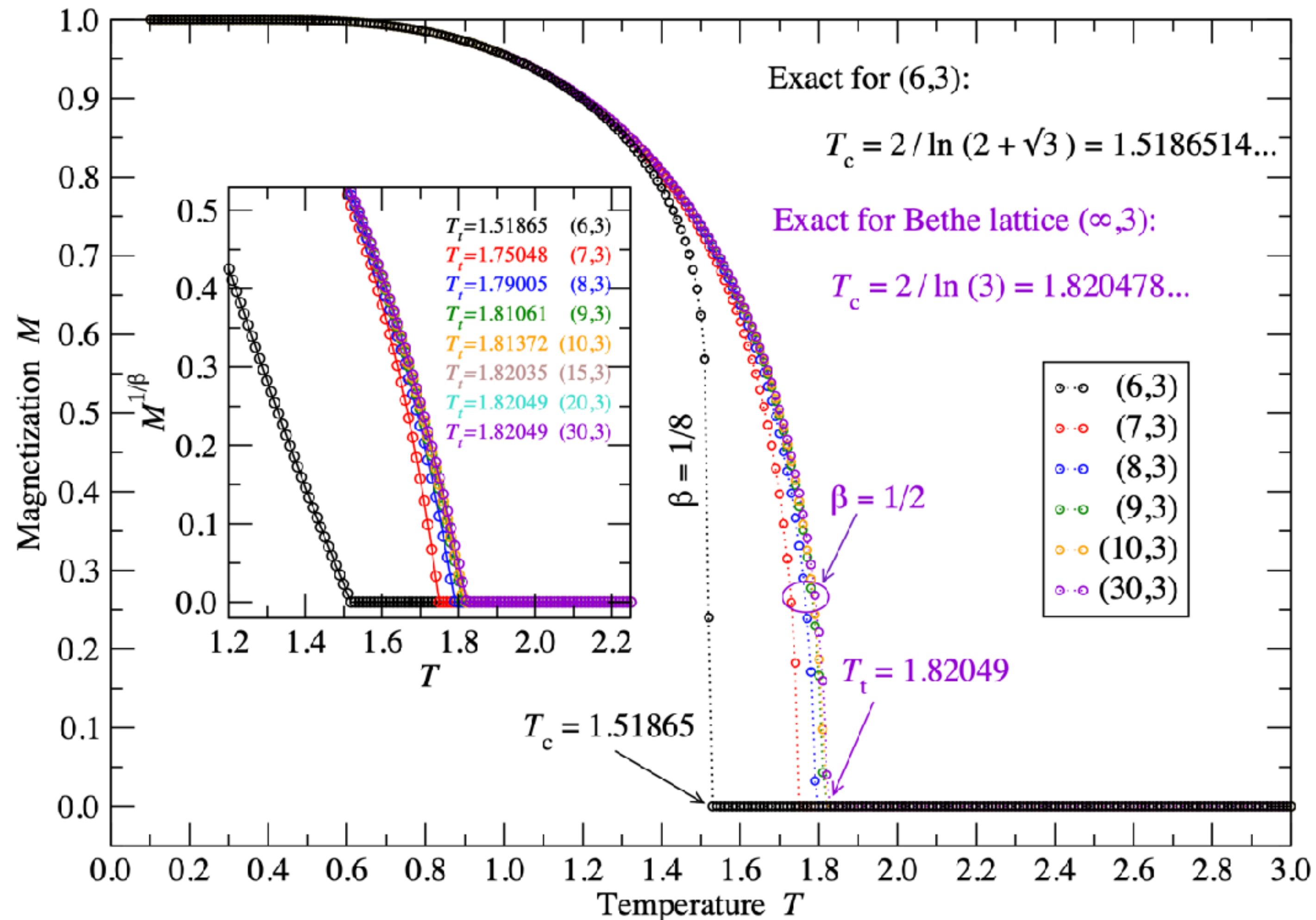
Magnetization for various p -gons at $q=3$

(mean-field universality)

CTMRG study



Ising model on $(p, 3)$ lattice geometries by CTMRG with $m = 20$



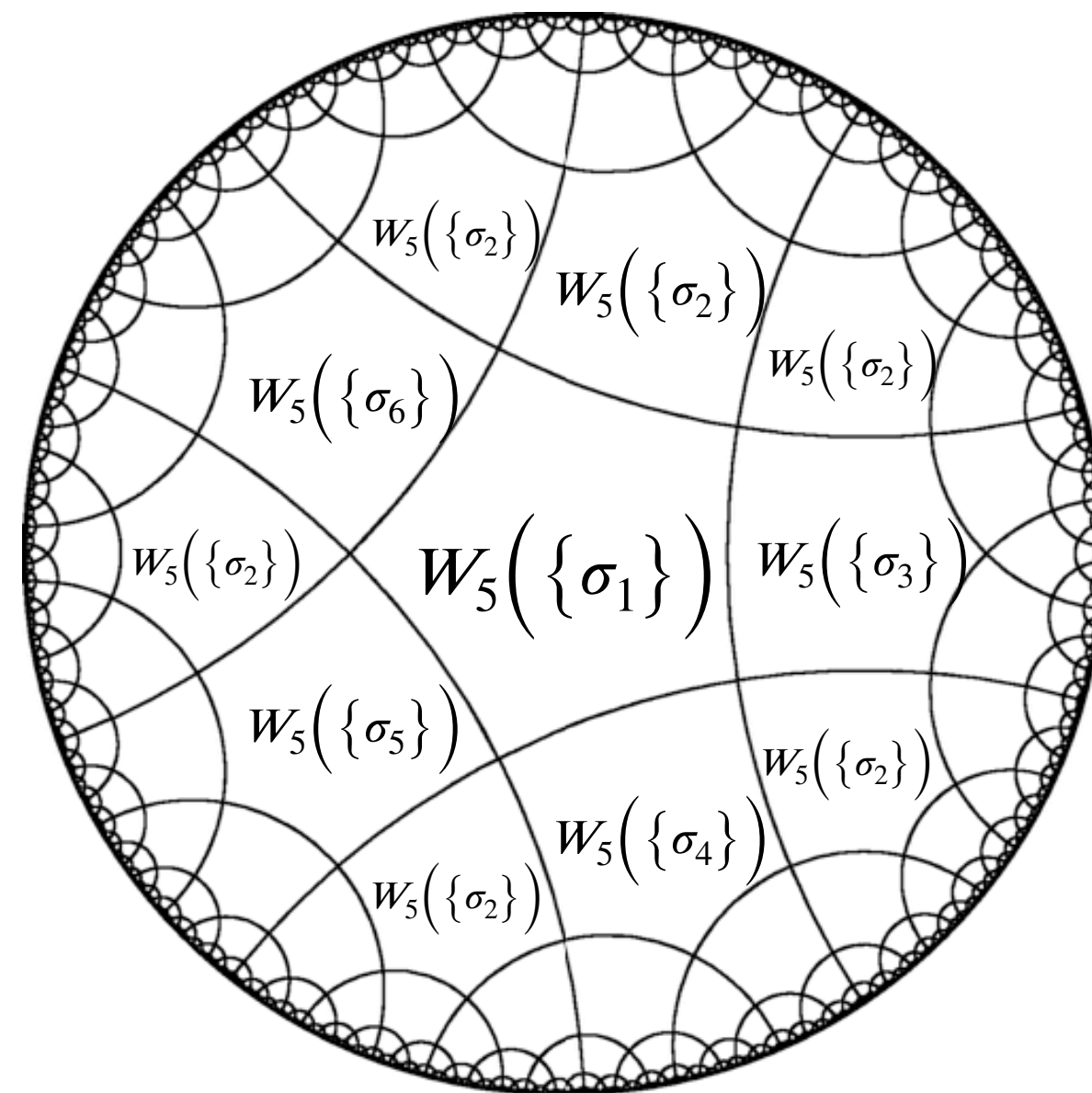
Extension to quantum systems

Details of the algorithms are skipped.

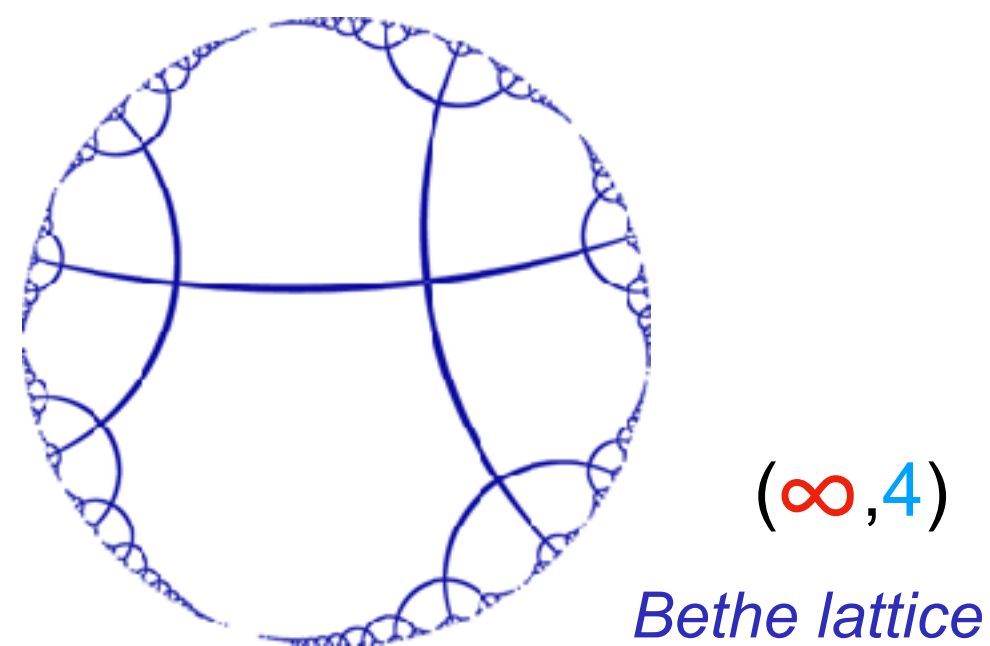
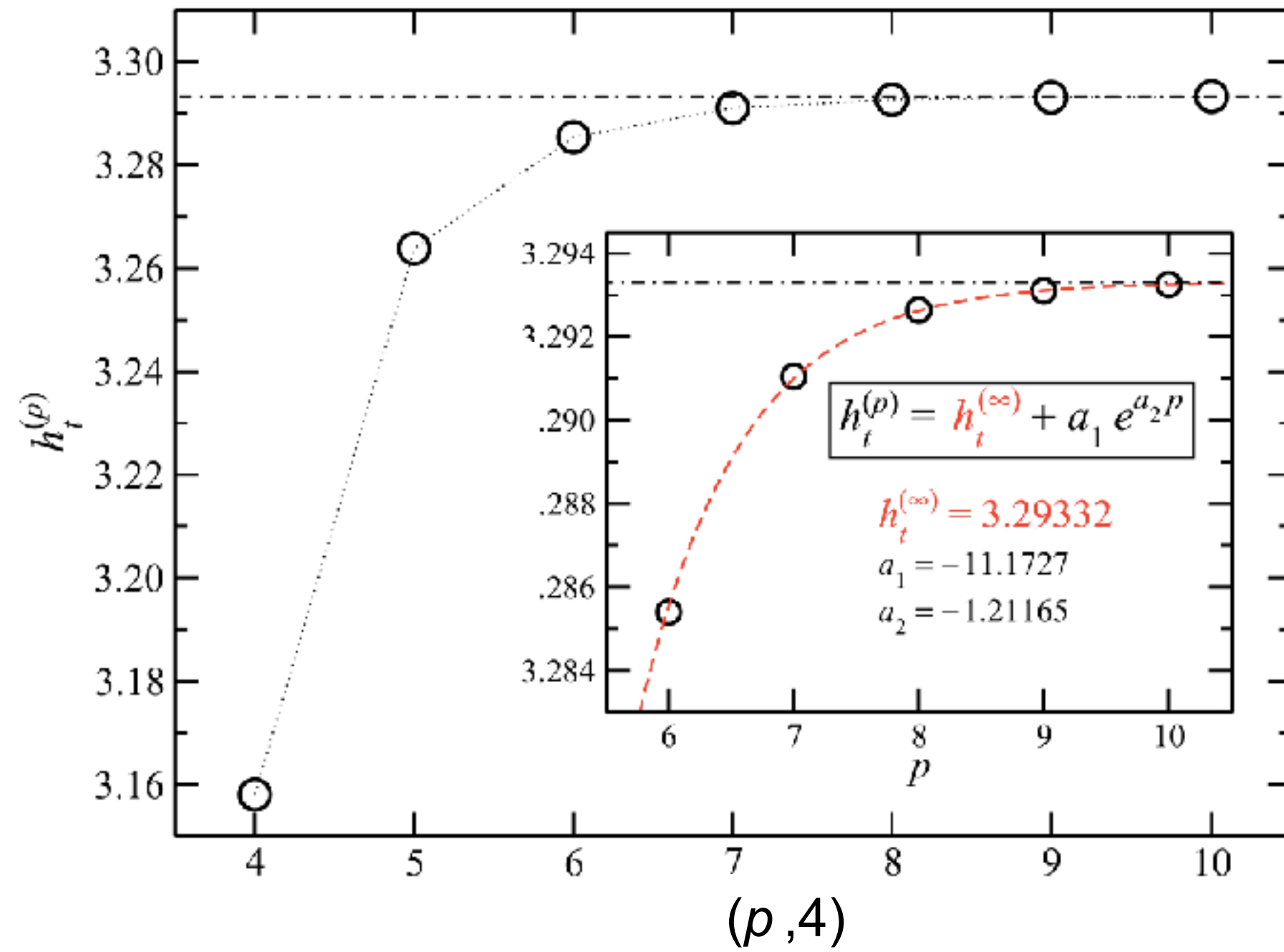
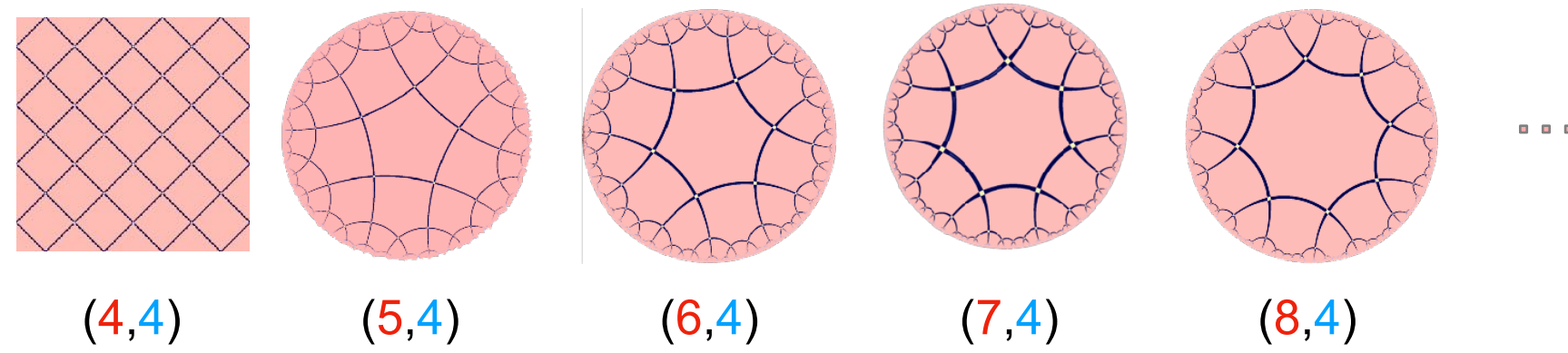
Tensor-Network algorithm

Tensor Product Variational Approximation (TPVA)

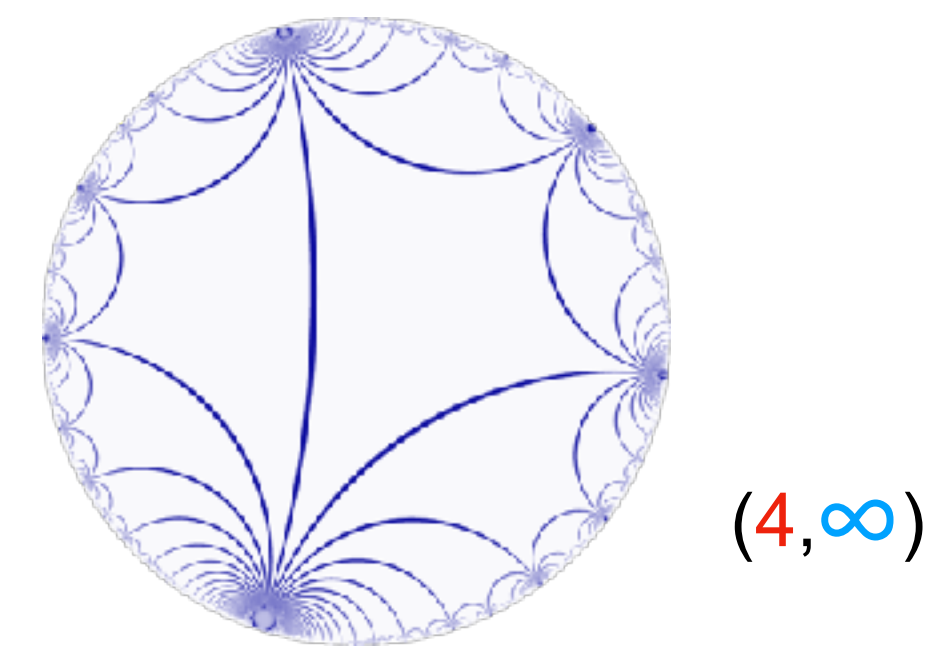
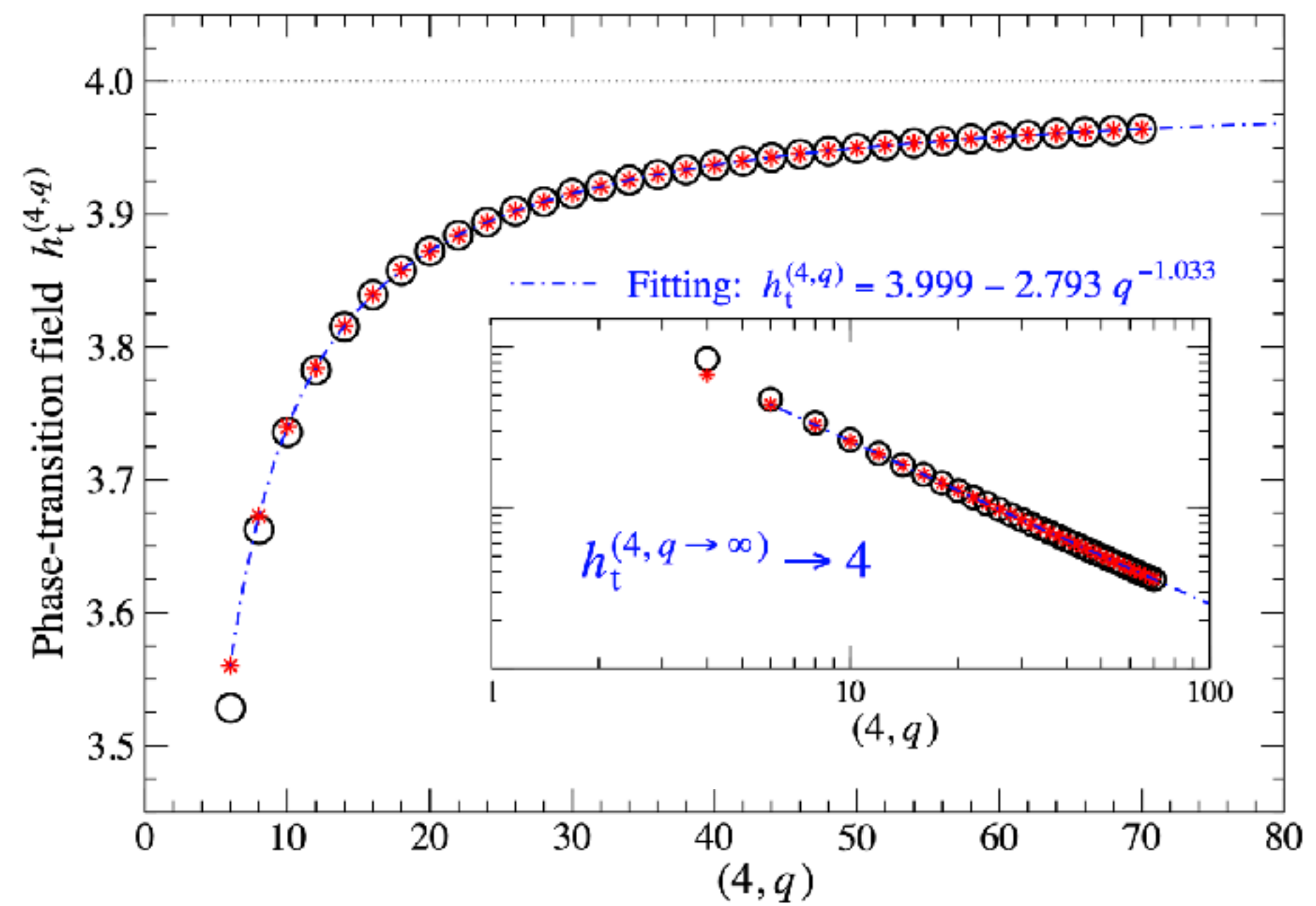
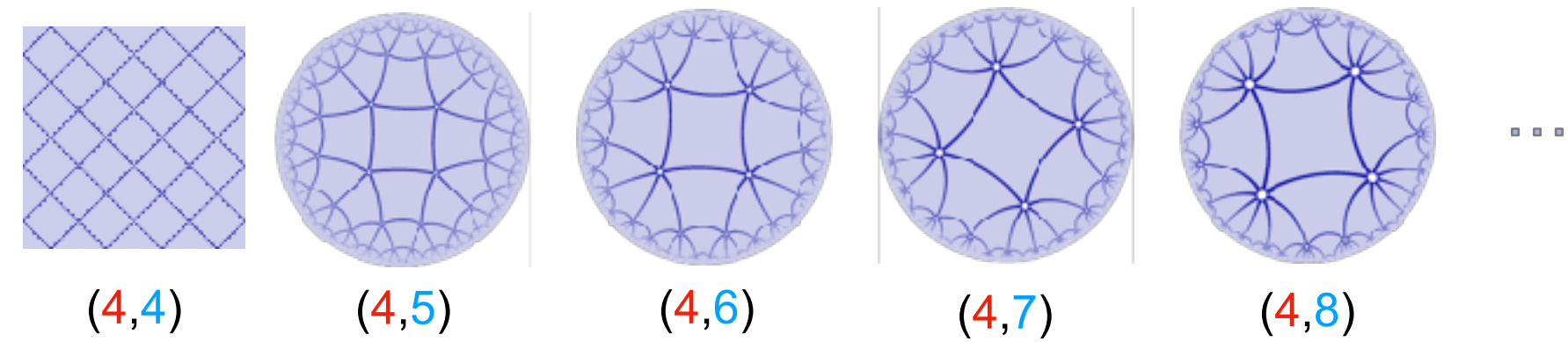
$$|\Psi_p\rangle = \lim_{N \rightarrow \infty} \sum_{\sigma_1 \sigma_2 \dots \sigma_N} \prod_{\langle k \rangle_p} W_p(\{\sigma_k\}) |\sigma_1 \sigma_2 \dots \sigma_N\rangle$$



Transverse-field Ising model on $(p,4)$



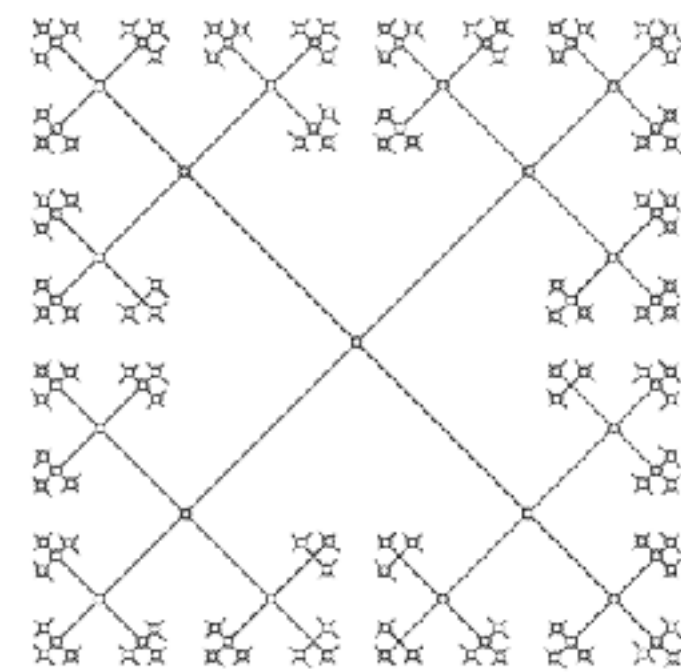
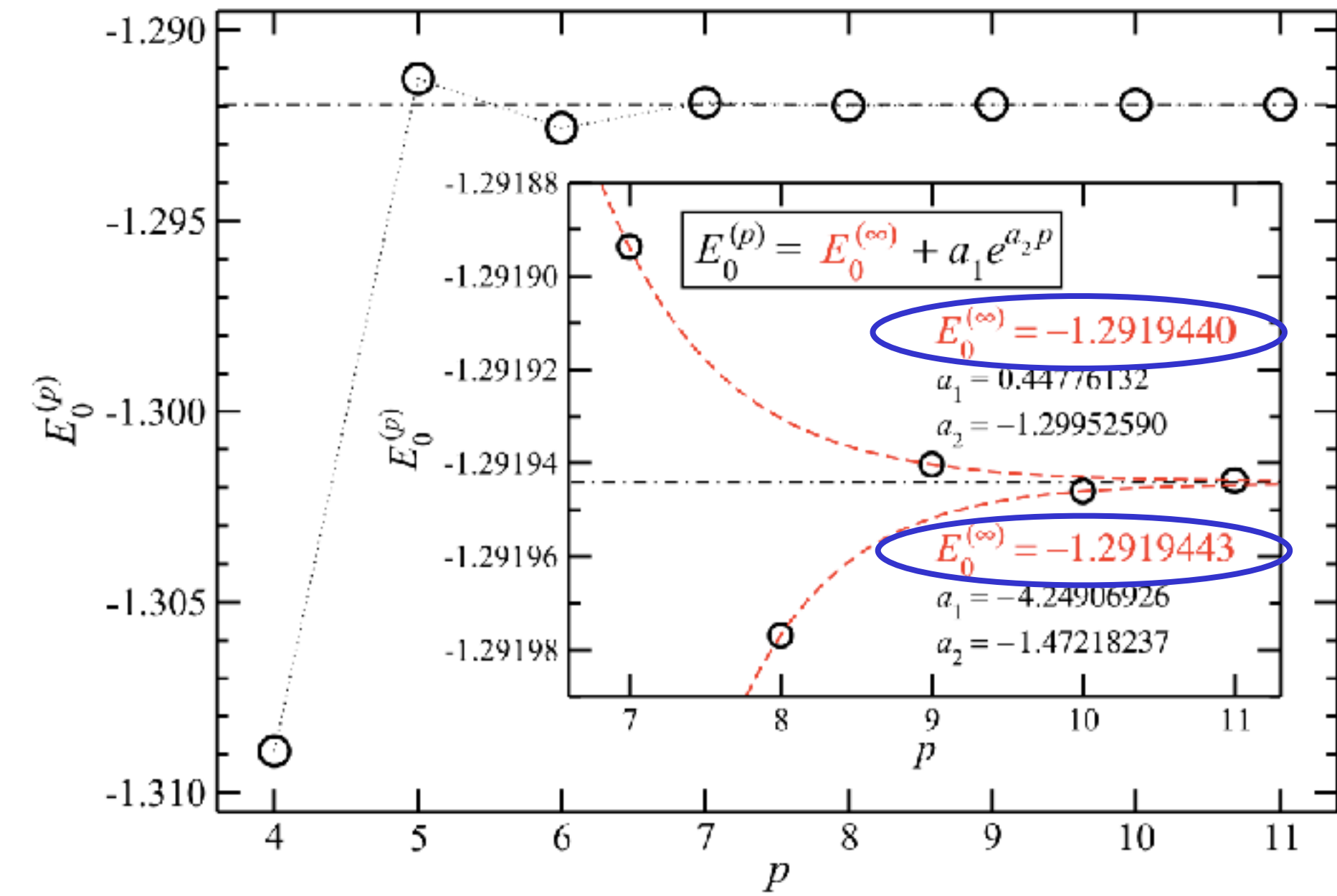
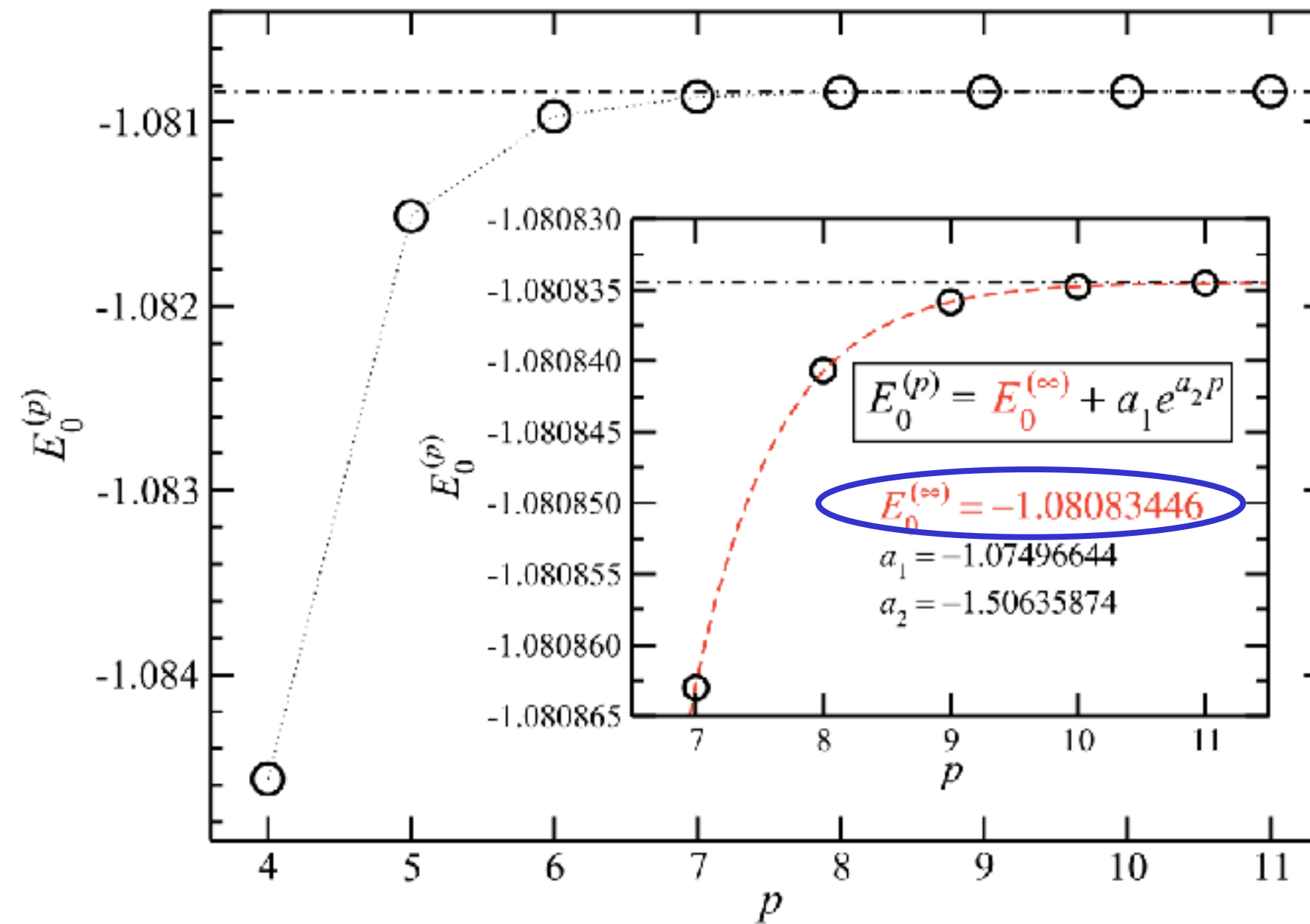
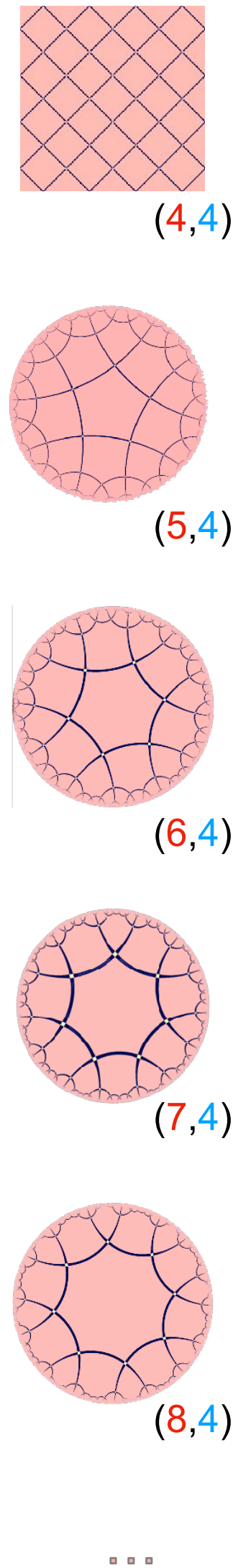
Transverse-field Ising model on $(4,q)$



The *polygon* (p -) scaling in **XY** and **Heisenberg** models on $(p,4)$ lattices

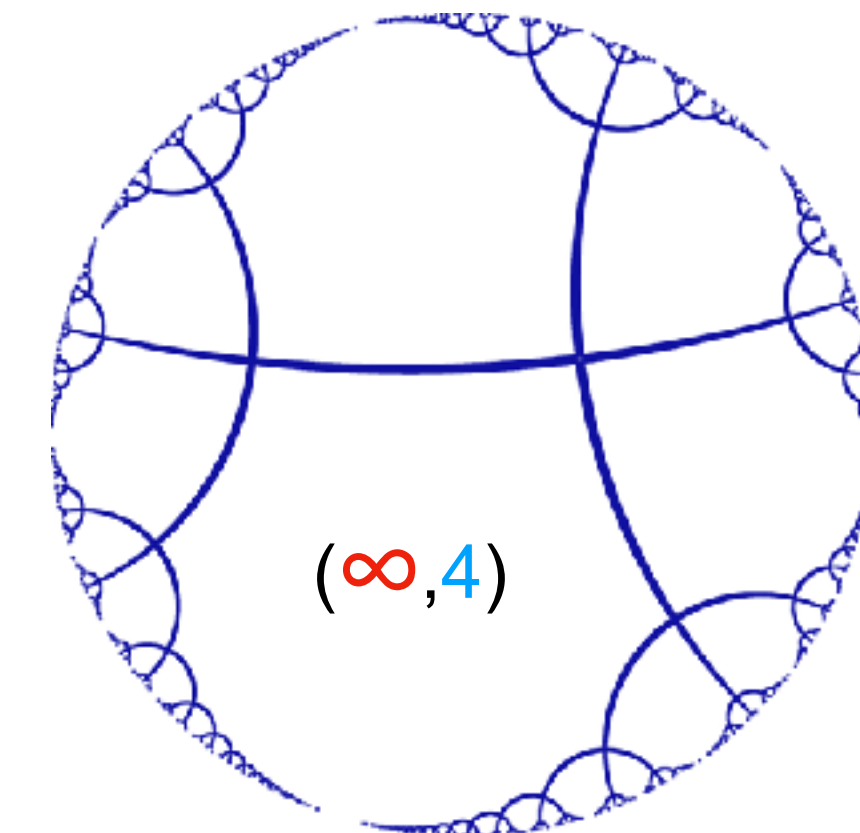
Ground-state energy of **XY** model on $(p,4)$

Ground-state energy of **Heisenberg** model on $(p,4)$

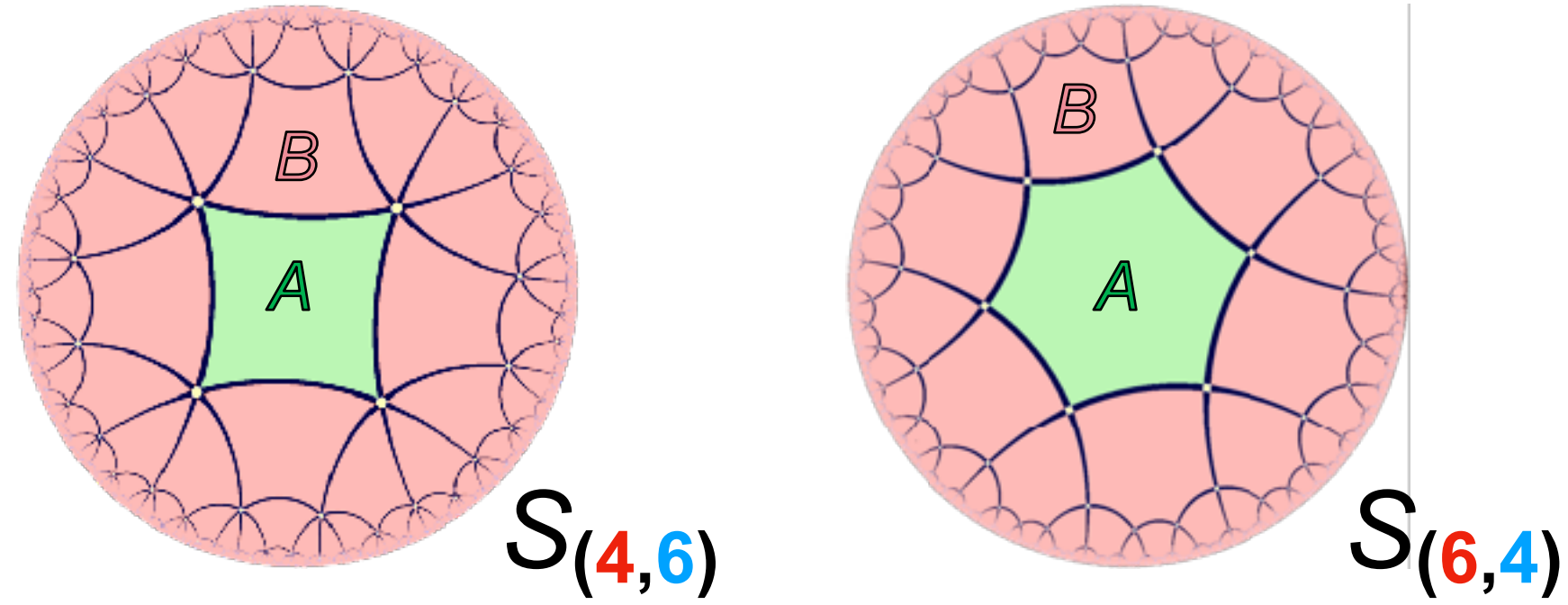


$(\infty,4)$ *Bethe lattice* \rightarrow

p	$E_0^{(p)}$	
	XY	Heisenberg
4	-1.08456618	-1.3089136
5	-1.08151200	-1.2912704
6	-1.08097046	-1.2925639
7	-1.08086301	-1.2918936
8	-1.08084068	-1.2919769
9	-1.08083585	-1.2919403
10	-1.08083478	-1.2919460
11	-1.08083453	-1.2919437
∞	-1.08083446	-1.291944

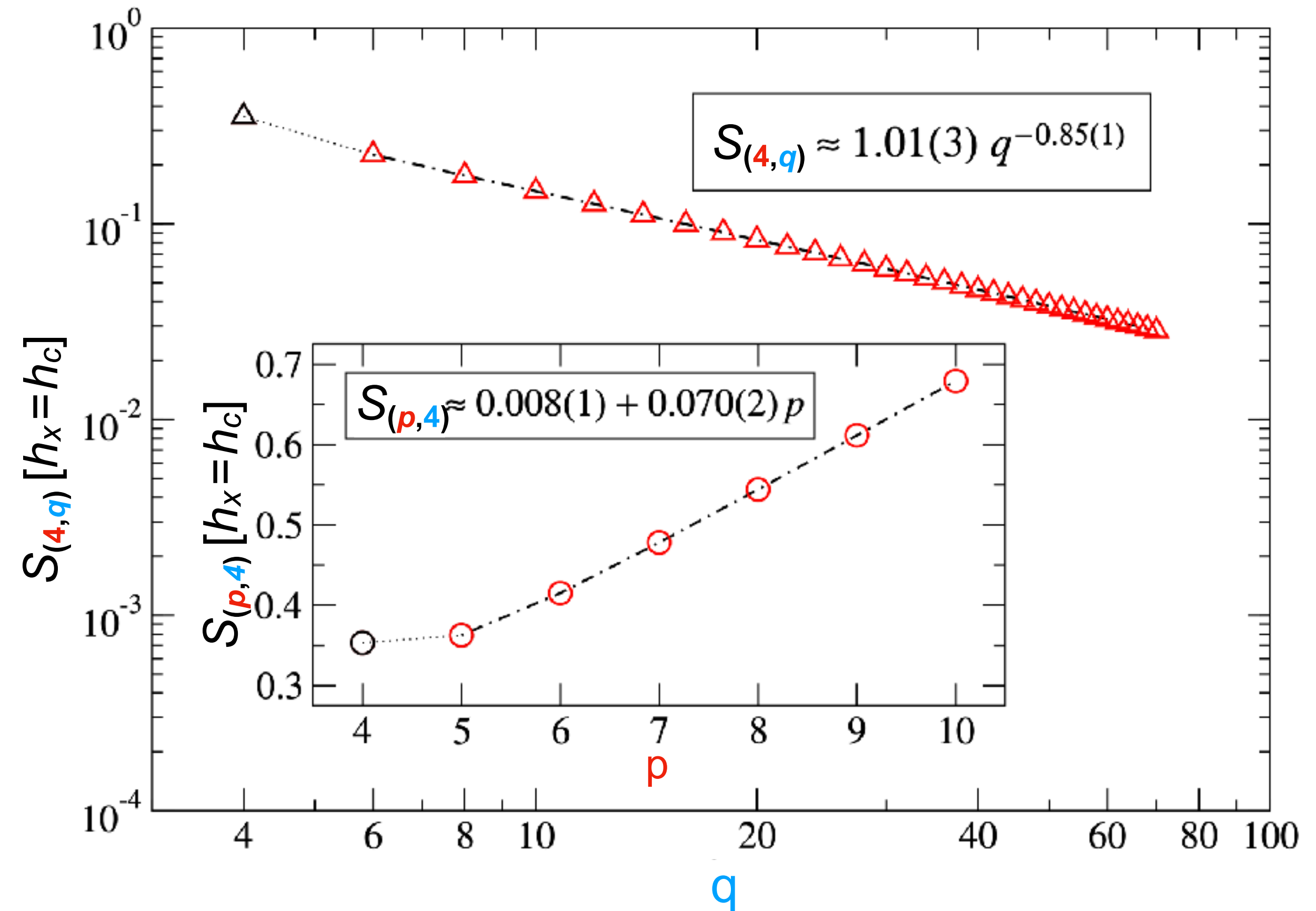
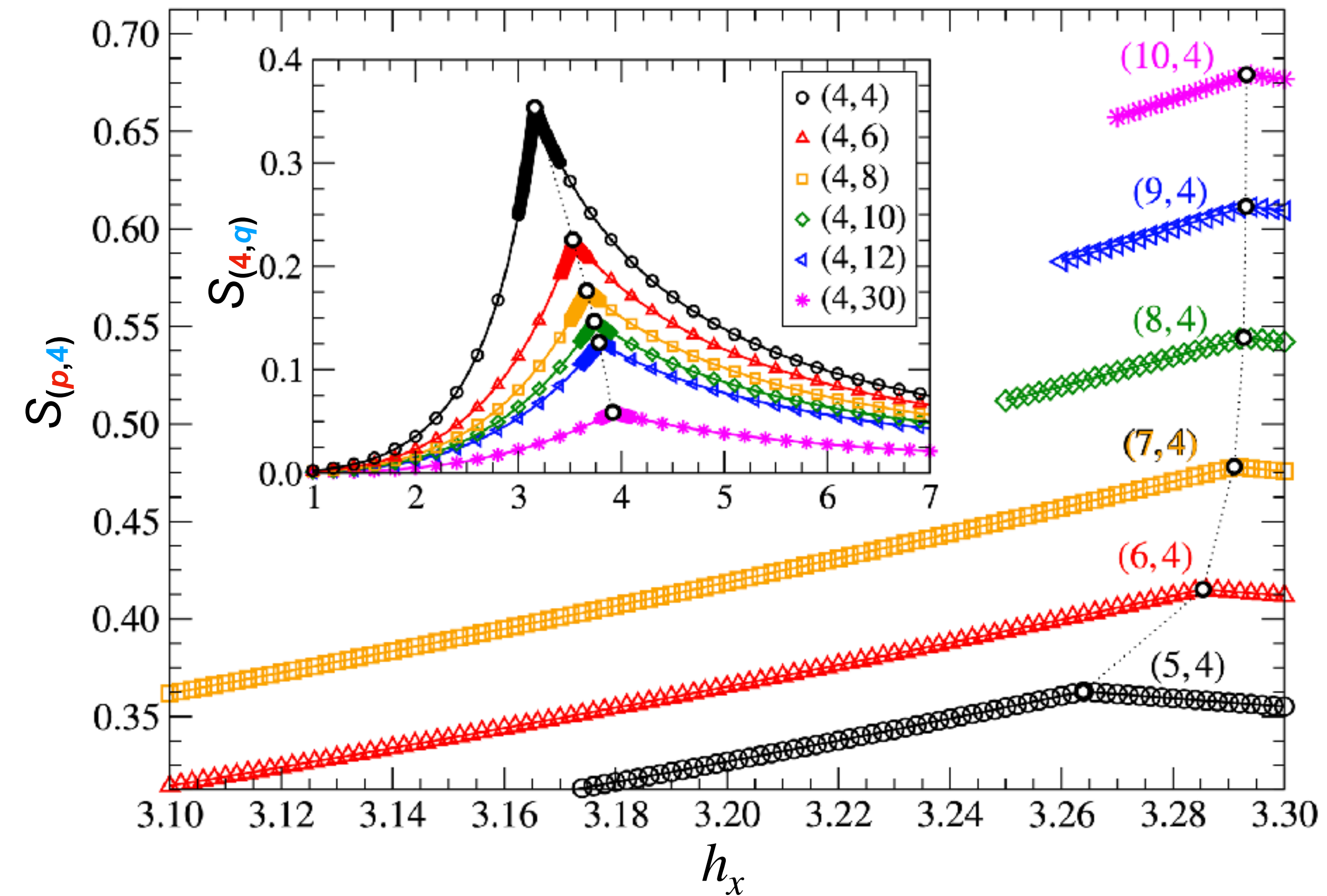


Entanglement entropy between the central subsystem **A** (polygon) in contact with the reservoir **B**



$$S_{(p,q)}[\mathbf{A}] = -\text{Tr}_B |\Psi_{AB}\rangle\langle\Psi_{AB}| \quad \text{on } \mathbf{(p,4) \& (4,q)}$$

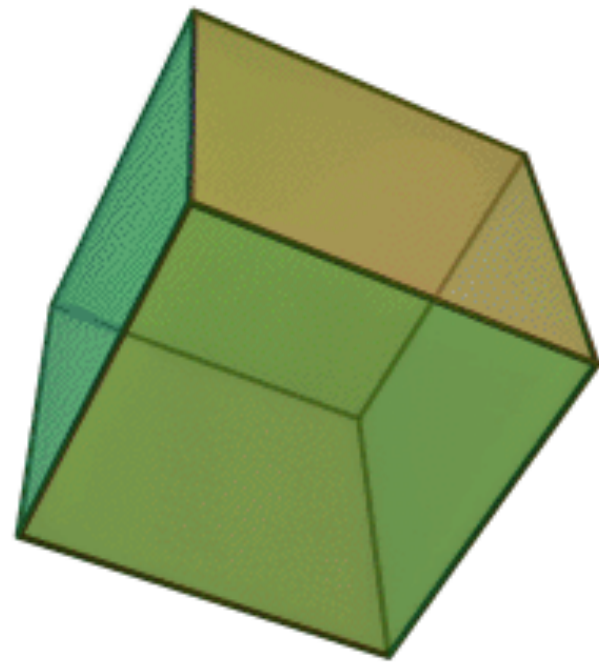
$$H = -\sum_{\{j,k\}} J_z S_j^z S_k^z - \sum_{\{j\}} h_x S_j^x$$



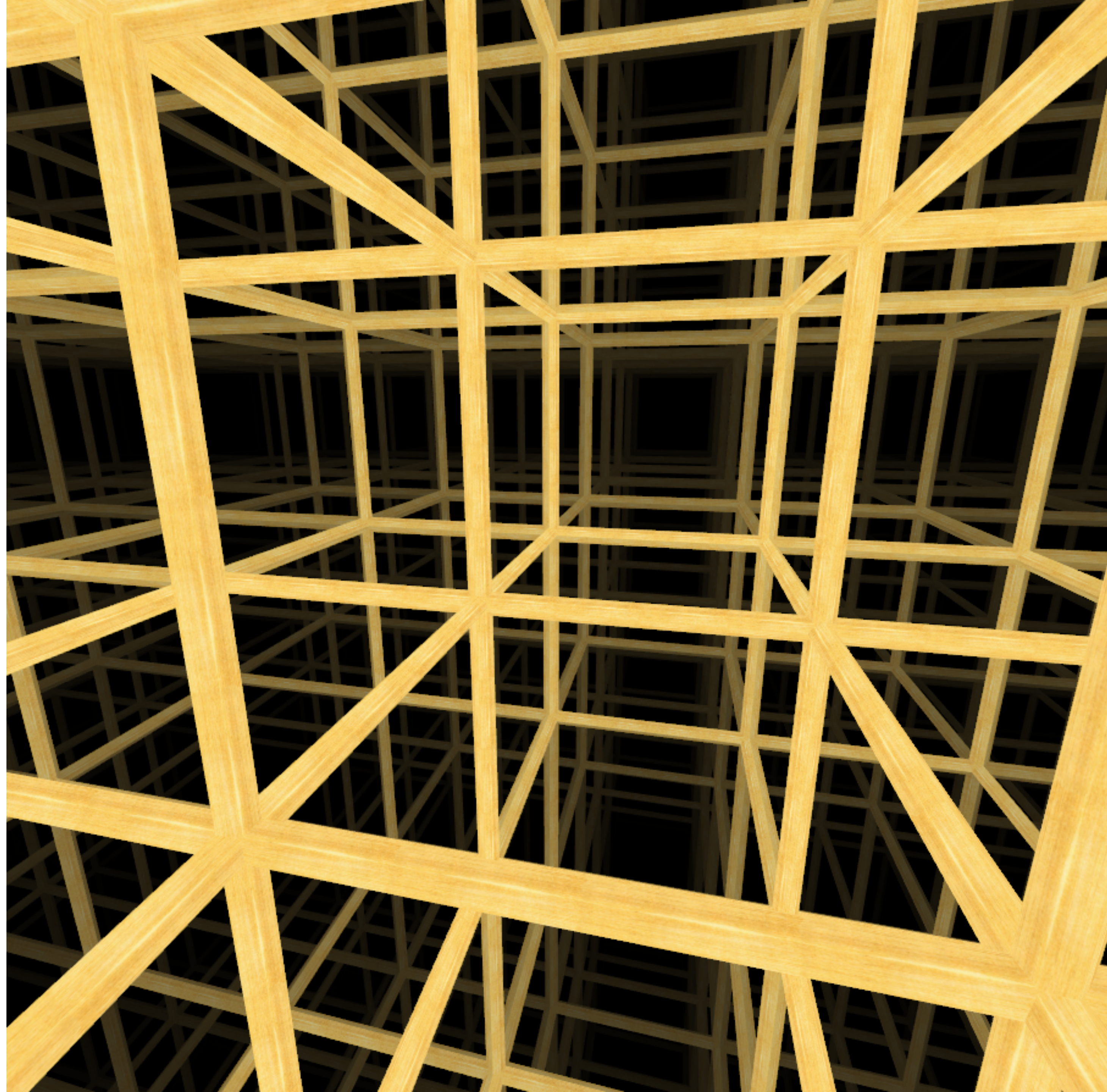
...more to be done?

3D Euclidean space

At each vertex,
there are 8 identical cubes.

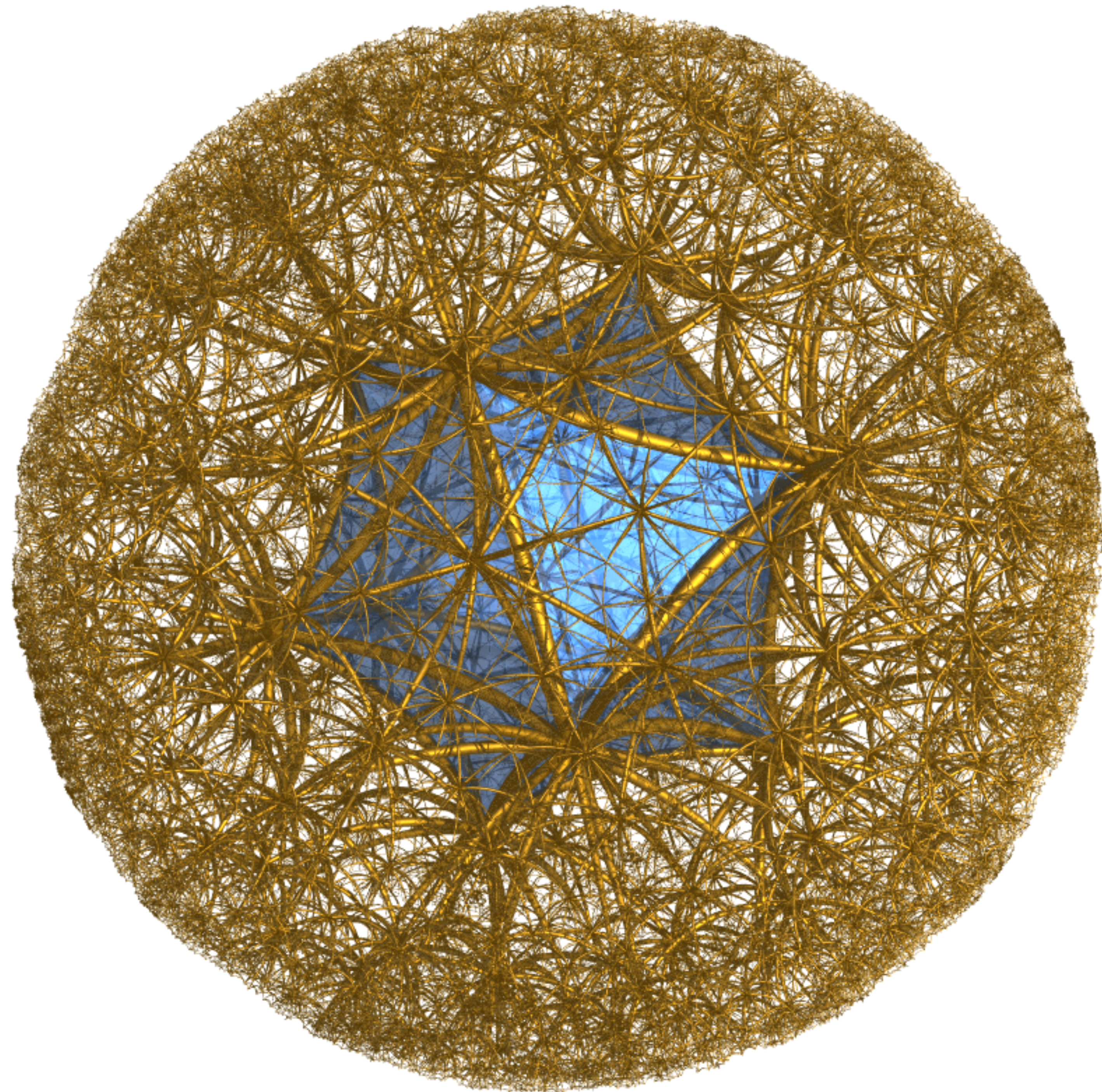
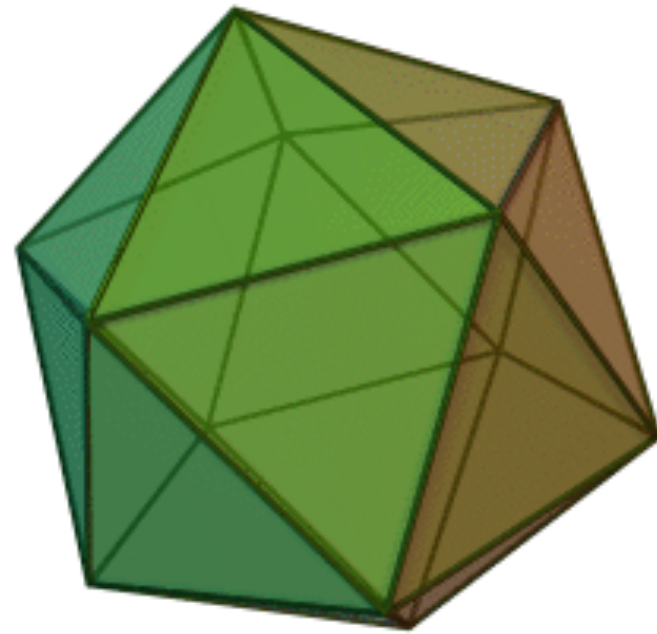


Can we construct a homogeneous hyperbolic 3D space (not surface) embedded in infinite dimensions?



3D Hyperbolic space

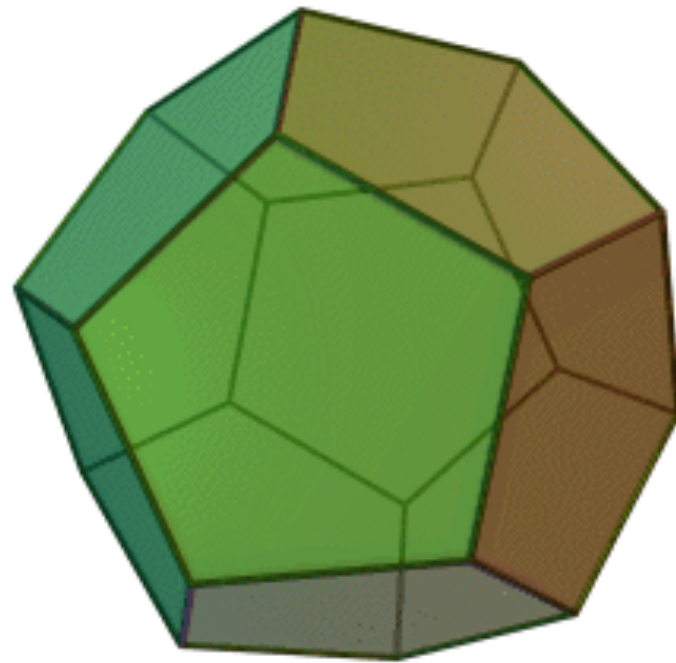
At each vertex,
there are 12 identical icosahedra.



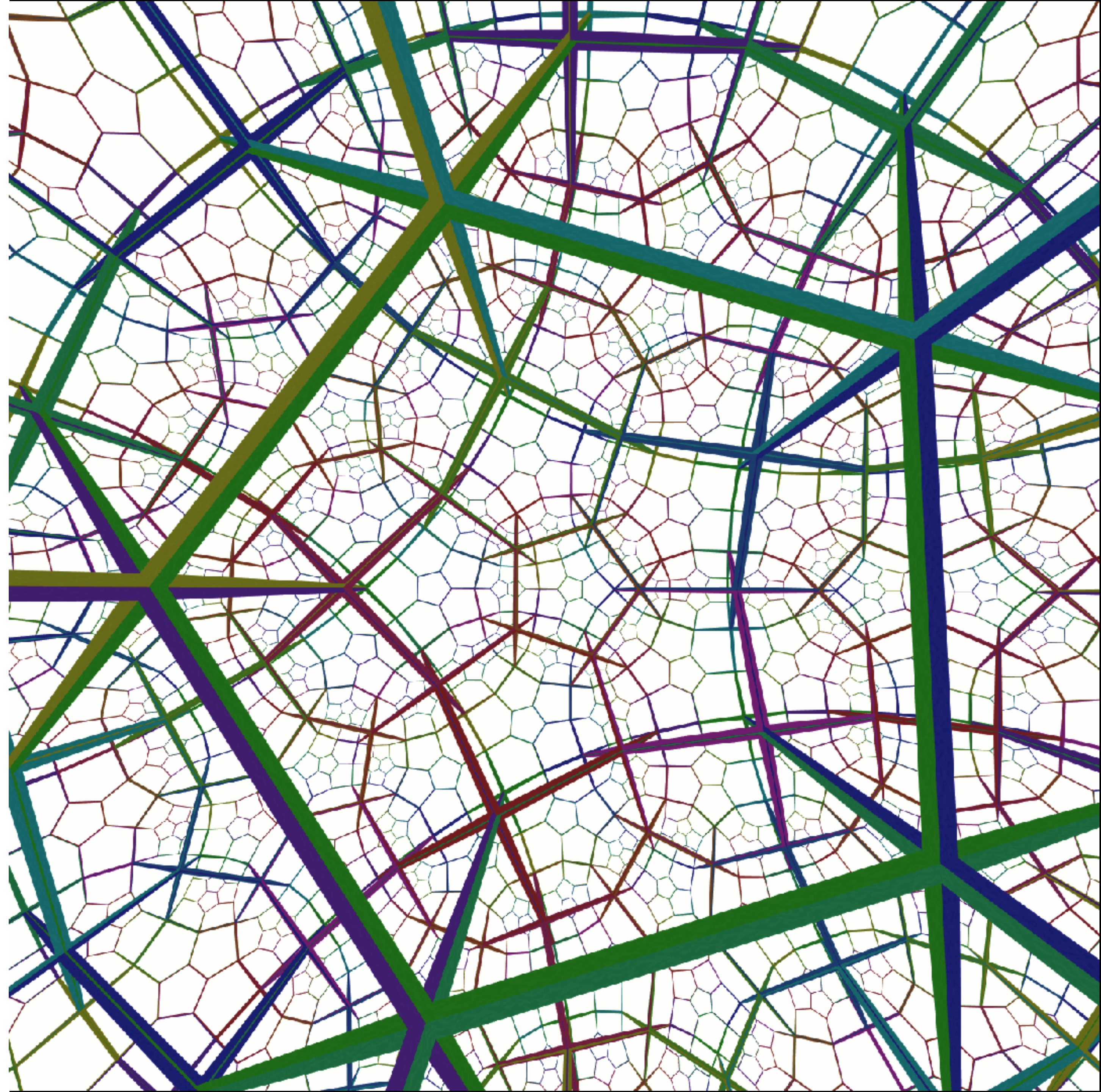
Poincaré sphere representation

3D Hyperbolic space

At each vertex,
there are 8 identical dodecahedra.

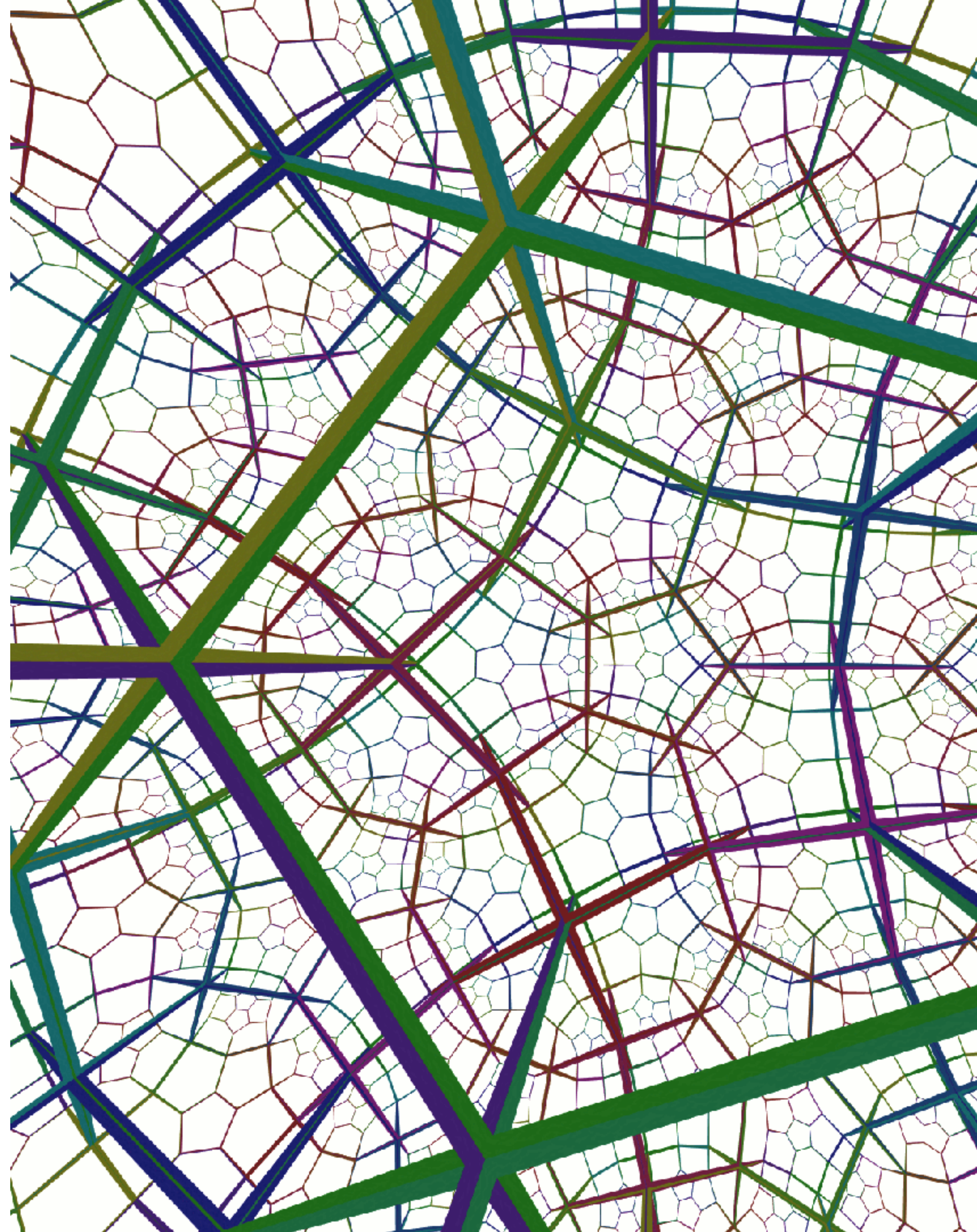
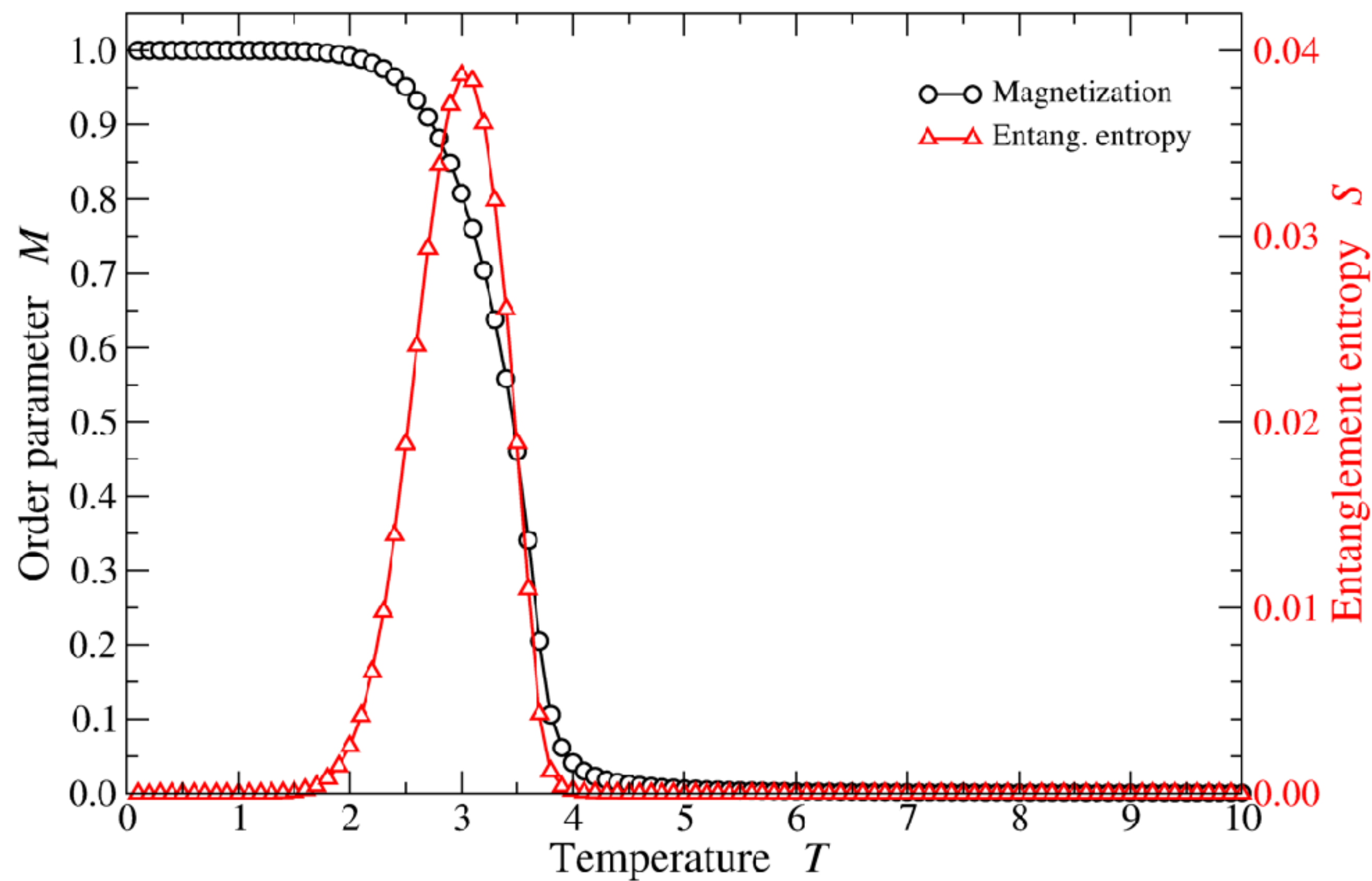
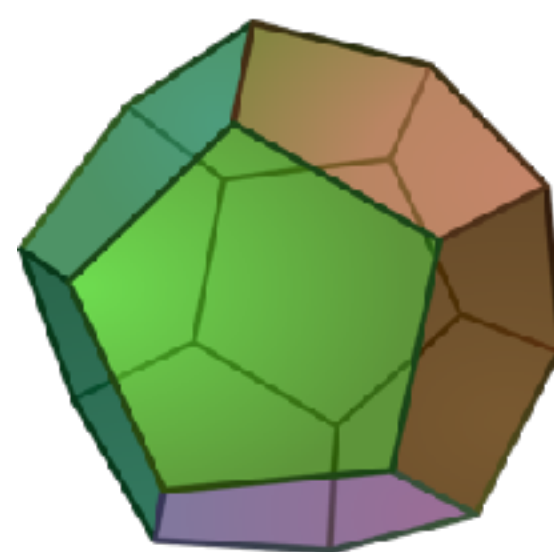


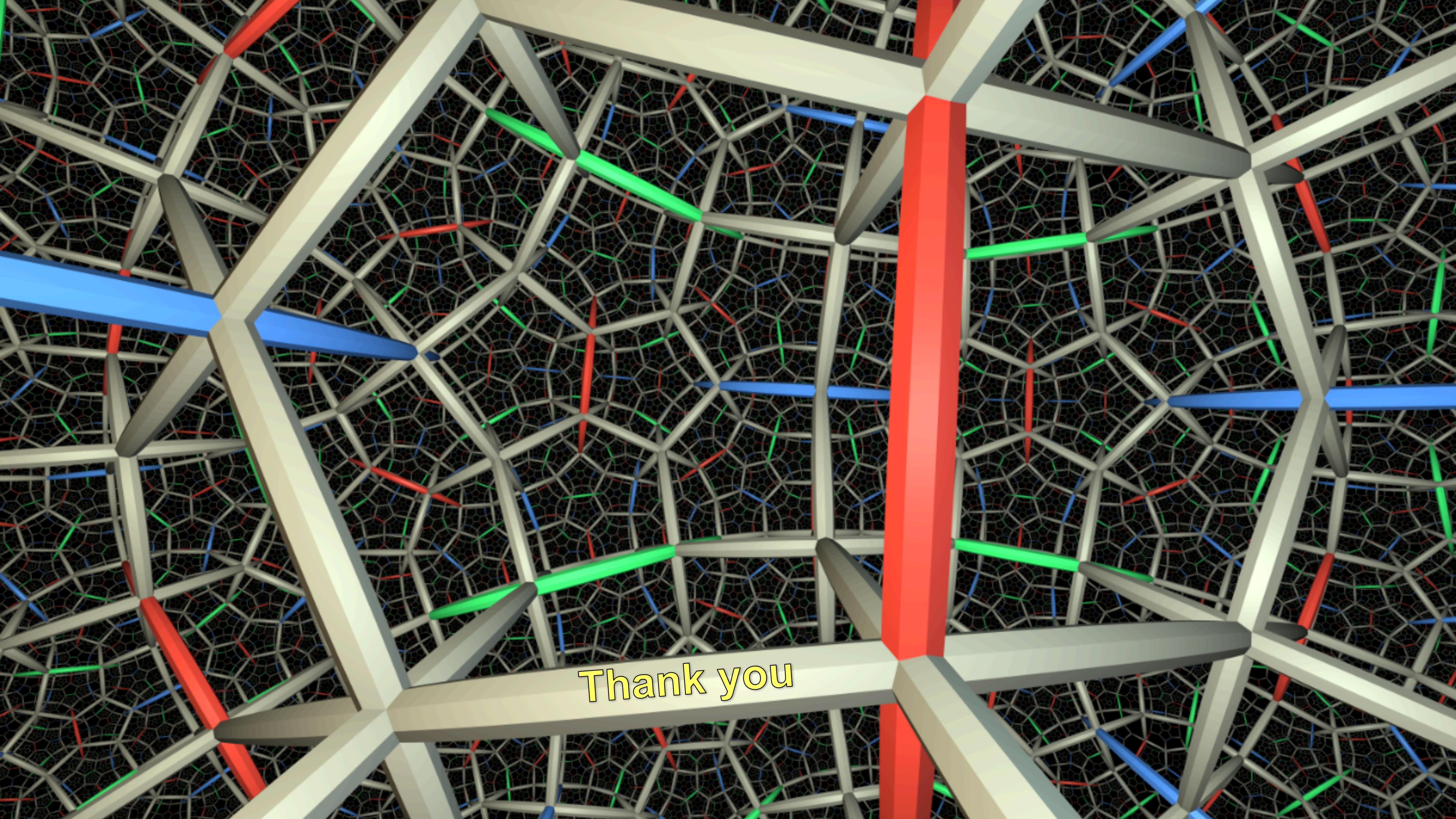
The coders' challenges
to blow-up imagination



Dodecahedra hyperspace

(The coordination # $q = 8$)





Thank you