

Understanding the stability of topologically-protected quantum computing proposals using spin glasses

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UNIVERSITY

Disclaimer

- **What is this talk about?**
 - Understand the stability of topologically-protected quantum computing proposals using spin glasses.
 - New applications of the glass machinery.
- **What is this talk not about?**
 - A talk on quantum computing.
 - A talk on spin glasses.
- **Brief outline:**
 - Error correction using topology.
 - Topological color codes.
 - Stability against bit flip and measurement errors.



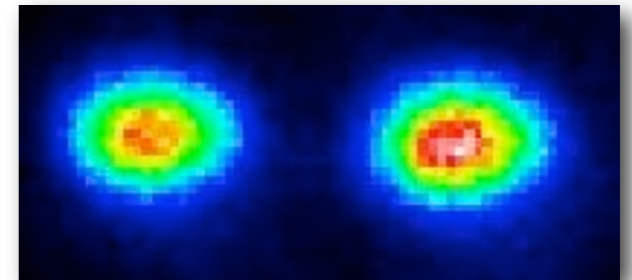
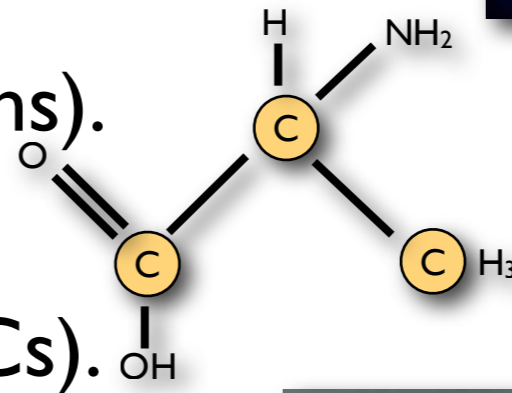
Motivation

General motivation

- **Why should we care about quantum computers?**
 - Faster computations (prime decomposition, search algorithms...).
 - Quantum cryptography.
 - Quantum simulators (Fermionic models, ...).

- **Current “working” implementations**

- Trapped ions (e.g., XOR via Be ions).
- Nuclear Magnetic Resonance.
- Solid state (quantum dots, JJAs, SCs).

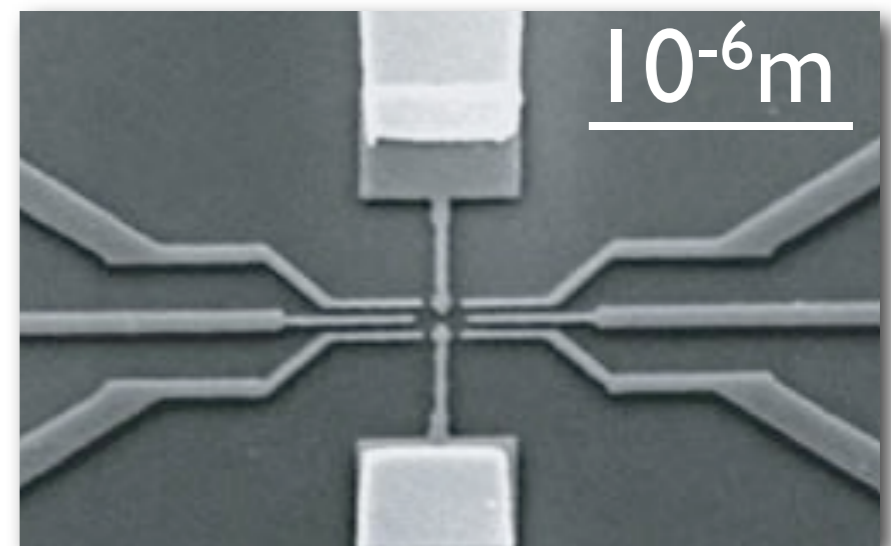


NIST (95)

IBM (01)

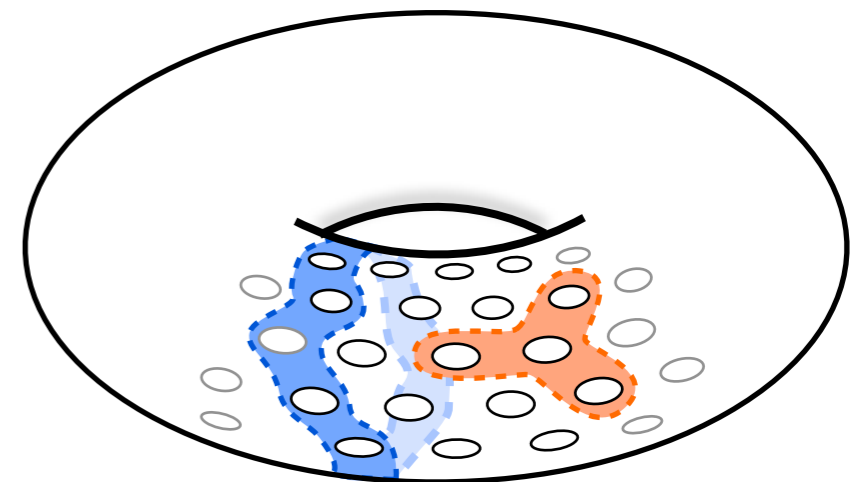
- **Problems:**

- Scalability (~ 100 qubits).
- Decoherence.



Decoherence

- **Sources of decoherence:**
 - Initial state preparation & faulty gate execution.
 - Local noise, interaction with a bath.
- **How can we overcome decoherence?**
 - Software: Better codes, smarter quantum error correction
 - Hardware: More qubits, error correction via redundancy
- **Problem:**
 - More qubits \longrightarrow more errors.
- **Solution: Use topology!**
 - Hardware encoding to protect states.
 - Software approach via active error correction.



Using topology for quantum computation

- **Fault-tolerant quantum computer:**

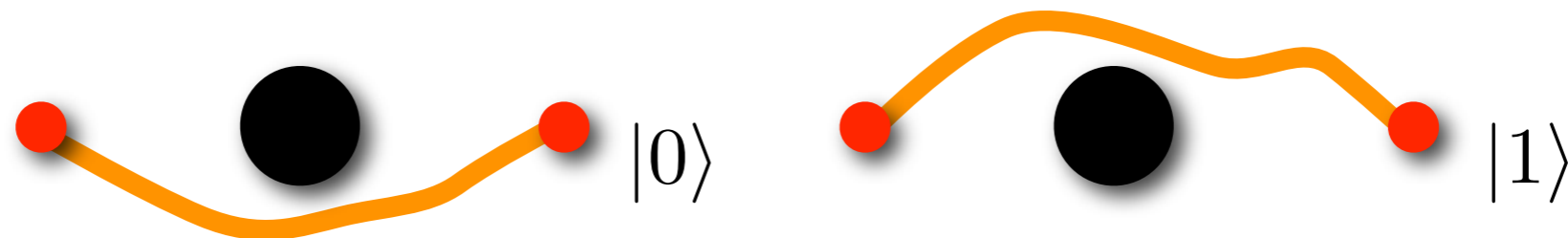
“A device that works efficiently even when its elementary components are imperfect.”

Preskill (97)



- **Topologically-protected quantum computation:**

- Errors happen *locally* (e.g., bit flips).
- Exploit the *global* (topological) properties of a system.
- Introduce active error correction (here software level).



- **First proposal: Toric code** Kitaev Ann. Phys. (03)

- Ground state is a (topological) loop gas.
- CNOT, X and Z Pauli gates can be implemented, $p_c \sim 10.9\%$.

Dennis *et al.* (02)

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Topological color codes

Topological color codes

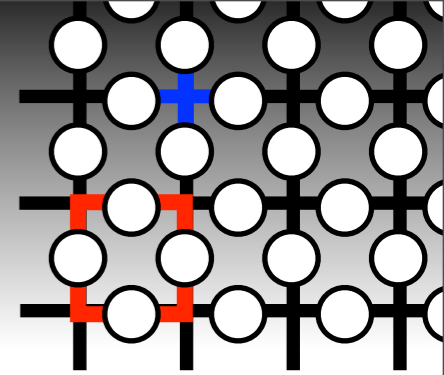
- **Alternative: Topological color codes**

- Similar to the Kitaev proposal.
- Encodes twice the number of qubits as a Toric (Kitaev) Code.
- The whole Clifford group of gates can be implemented.
- The phase gate K can be implemented transversally.

$$K = \begin{pmatrix} 1 & 0 \\ 0 & i \end{pmatrix}$$

- **How do color codes work?**

- Defined in terms of a (local) stabilizer group.
- Measurement detects the errors.
- Active error correction applies (up to a threshold).



Toric Code

Kitaev (97)

$$\mathcal{H} = - \sum_s A_s - \sum_p B_p$$

stabilizer $A_s = \prod_{j \in +_s} Z_j$

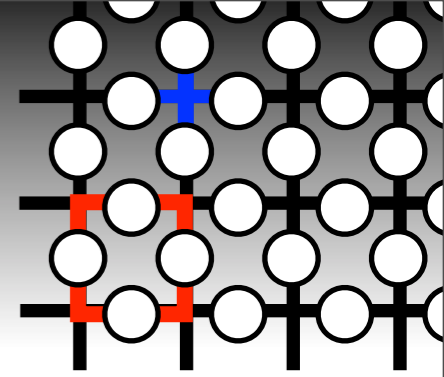
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Do wider computational capabilities imply a lower resistance to noise?

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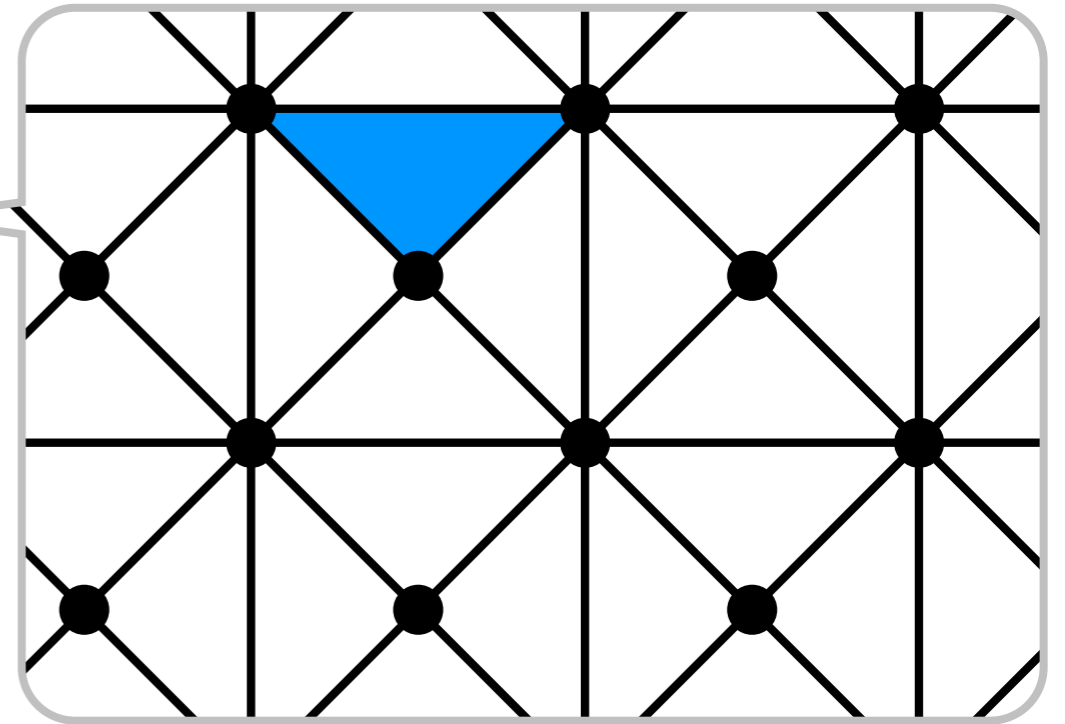
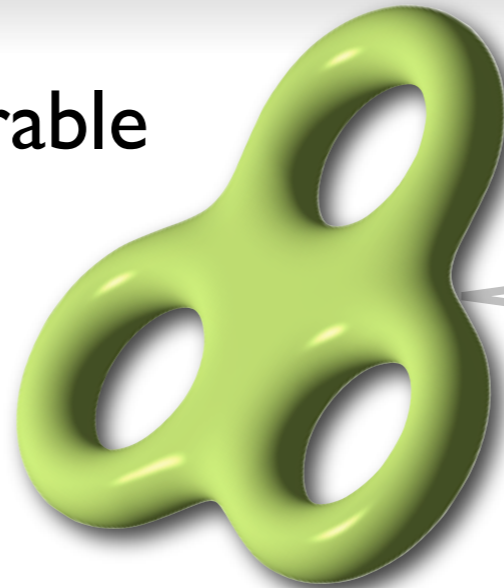
stabilizer

$$B_p = \prod_{j \in \square_p} X_j$$

Topological color codes (the details)

Bombin & Martin-Delgado, PRL (06)

- Start from a 2D 3-colorable **triangular** lattice.
- Embed the lattice in a nontrivial compact surface.
- 4/8 triangles per vertex (phase gate).
- A **qubit** is placed on each triangle.
- Stabilizer group:



$$X_v := \bigotimes_{\Delta: v \in \Delta} X_{\Delta} \quad Z_v := \bigotimes_{\Delta: v \in \Delta} Z_{\Delta}$$

Note: vertex operators pairwise commute and square to unity.

- The code is defined on the subspace with $X_v = Z_v = 1 \quad \forall v$.
- Error syndrome: collection of ± 1 eigenvalues.
- X (bit-flip) and Z (phase) operators do not mix: *study only bit flips*.

Bit-flip errors

Threshold: map to a statistical model

- **Error correction is achievable if:**

$$\sum_E P(E) P(\bar{E} | \partial E) \rightarrow 1 \quad N \rightarrow \infty$$

Dennis et al., J Math Phys (02)

- $P(E) \propto [p/(1-p)]^{|E|}$ E is a bit-flip error with probability p

- $P(\bar{E} | \partial E)$ probability that a syndrome ∂E was caused by an error in the homology class \bar{E} .

- **Mapping:**

- Nishimori line: $\exp(-2J) = p/(1-p) \longrightarrow P(E) \propto \exp(\sum_{\Delta} \tau_{\Delta})$

- $\tau_{\Delta} = \pm 1$; negative when $\Delta \in E$.

- Insert classical spin variables $S^i = \pm 1$ at the vertices to obtain:

$$P(\bar{E}) \propto Z[J, \tau] := \sum_S e^{J \sum_{\langle ijk \rangle} \tau_{ijk} S^i S^j S^k}$$

Katzgraber et al., PRL (09), PRA (10)

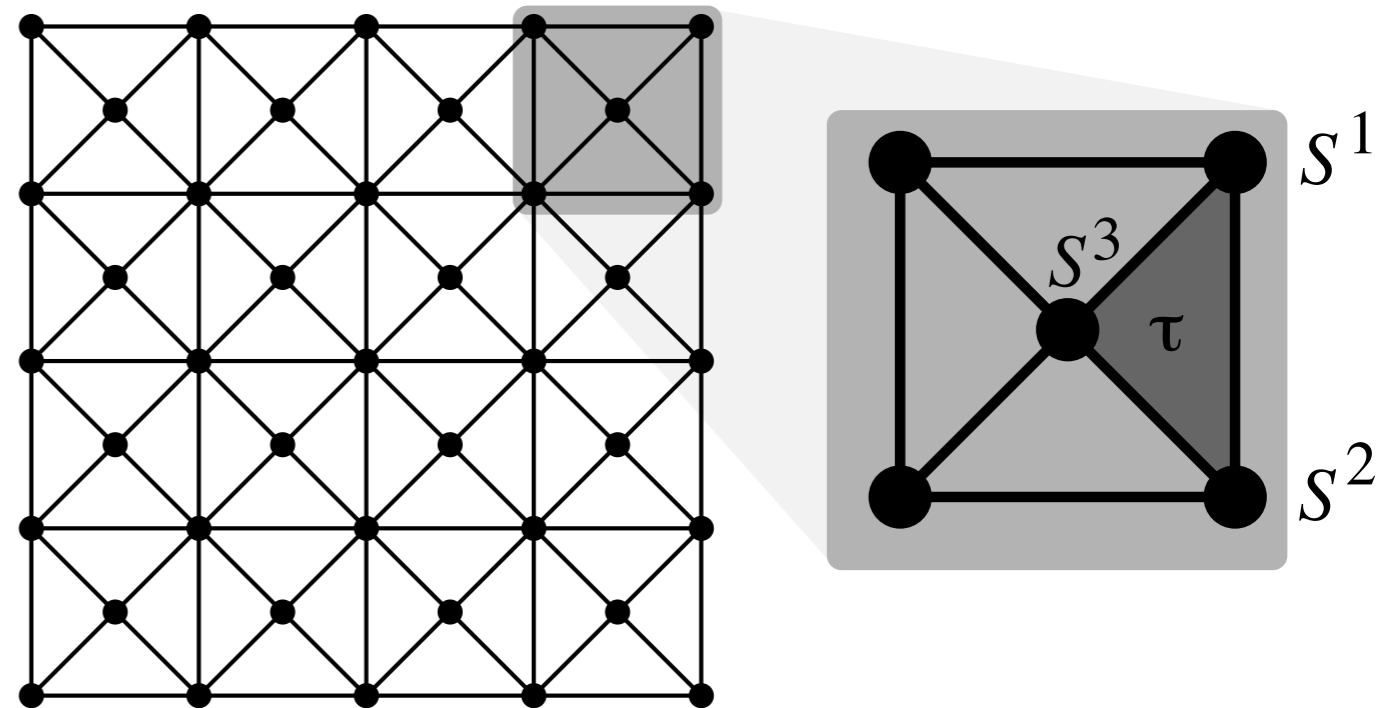
Bit-flip errors: random 3-body Ising model

- **Hamiltonian:**

$$\mathcal{H} = J \sum_{\langle ijk \rangle} \tau_{ijk} S^i S^j S^k$$

- **Details:**

- Ising spins S on the vertices of a 2D Union Jack lattice.
- A bit-flip error corresponds to $\tau_{ijk} = -1$ with probability p .
- $p > 0$: glassy Ising model (3-body interactions).
- Note: the Toric Code maps onto a 2D random-bond Ising model.



- **Error threshold:**

- Compute the $p-T_c$ phase diagram of the model.
- p_c corresponds to the critical p along the Nishimori line where ferromagnetic order is lost. [Dennis et al., J Math Phys \(02\)](#)

Interlude: Algorithms

Monte Carlo & the Metropolis algorithm

THE JOURNAL OF CHEMICAL PHYSICS

VOLUME 21, NUMBER 6

JUNE, 1953

Equation of State Calculations by Fast Computing Machines

NICHOLAS METROPOLIS, ARIANNA W. ROSENBLUTH, MARSHALL N. ROSENBLUTH, AND AUGUSTA H. TELLER,
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EDWARD TELLER,* *Department of Physics, University of Chicago, Chicago, Illinois*

(Received March 6, 1953)

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II. THE GENERAL METHOD FOR AN ARBITRARY POTENTIAL BETWEEN THE PARTICLES

In order to reduce the problem to a feasible size for numerical work, we can, of course, consider only a finite number of particles. This number N may be as high as several hundred. Our system consists of a square† con-

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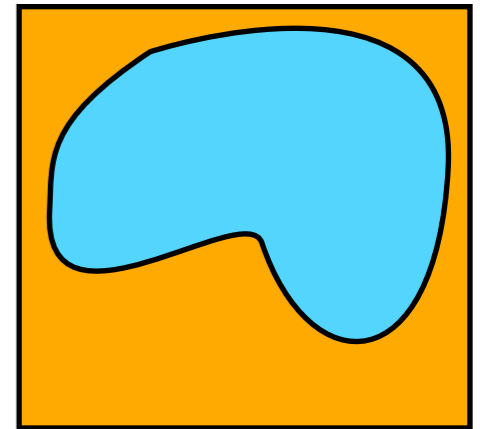
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Standard Monte Carlo

- **Goal:** Compute a thermodynamic average of an observable O :

$$\langle O \rangle = \sum_n P_n^{\text{eq}} O_n \quad P_n^{\text{eq}} = \frac{e^{\beta E_n}}{\sum_n e^{-\beta E_n}}$$



- **Problem:** The number of states is exponentially large (N Ising spins $\longrightarrow 2^N$ states).

- **Solution:** Statistically sample a subset of smartly chosen states but with a statistical error.

- Select the states according to P_n^{eq} to obtain a Markov chain for $\langle O \rangle_{\text{est}}$

$$\langle O \rangle_{\text{est}} = \frac{1}{M} \sum_i^M O_i \quad M \text{ is the number of trials.}$$

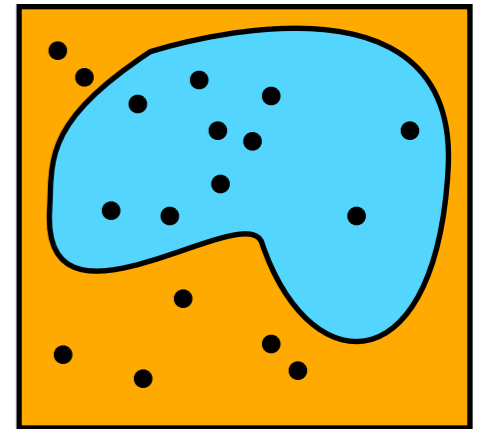
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- The systems we are interested in have rugged energy landscapes.
- At low temperature, when ΔE is large

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is “never” accepted.



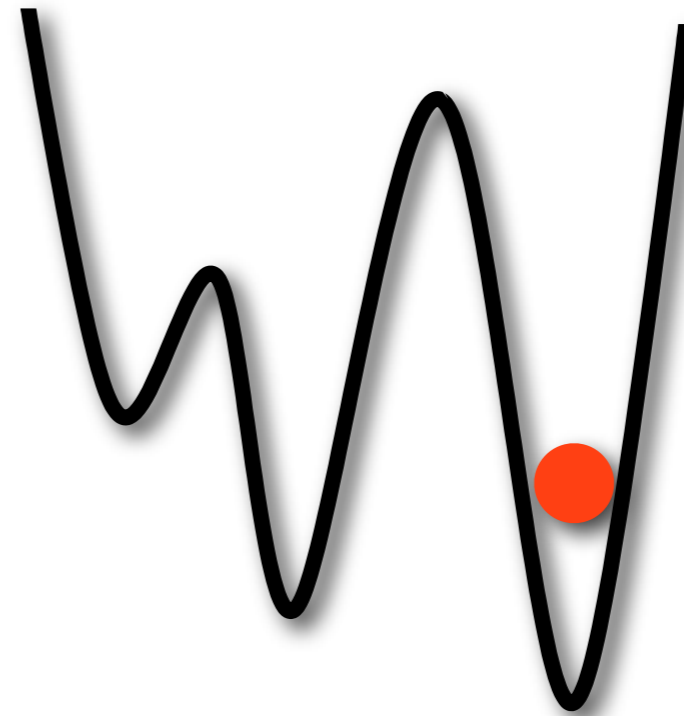
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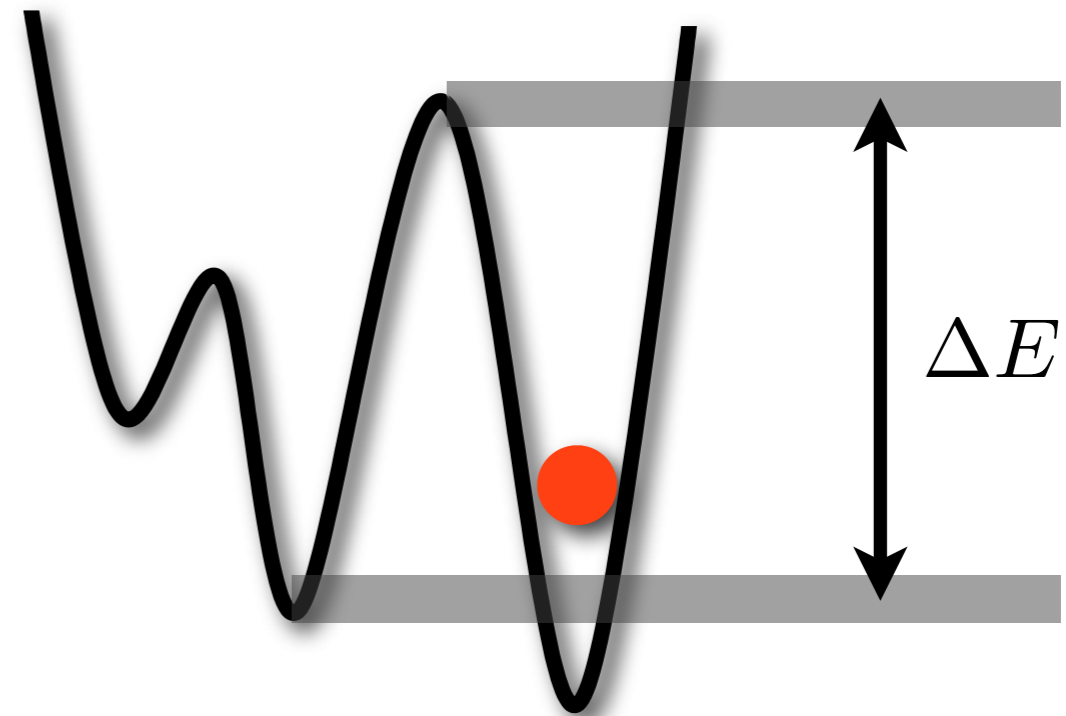
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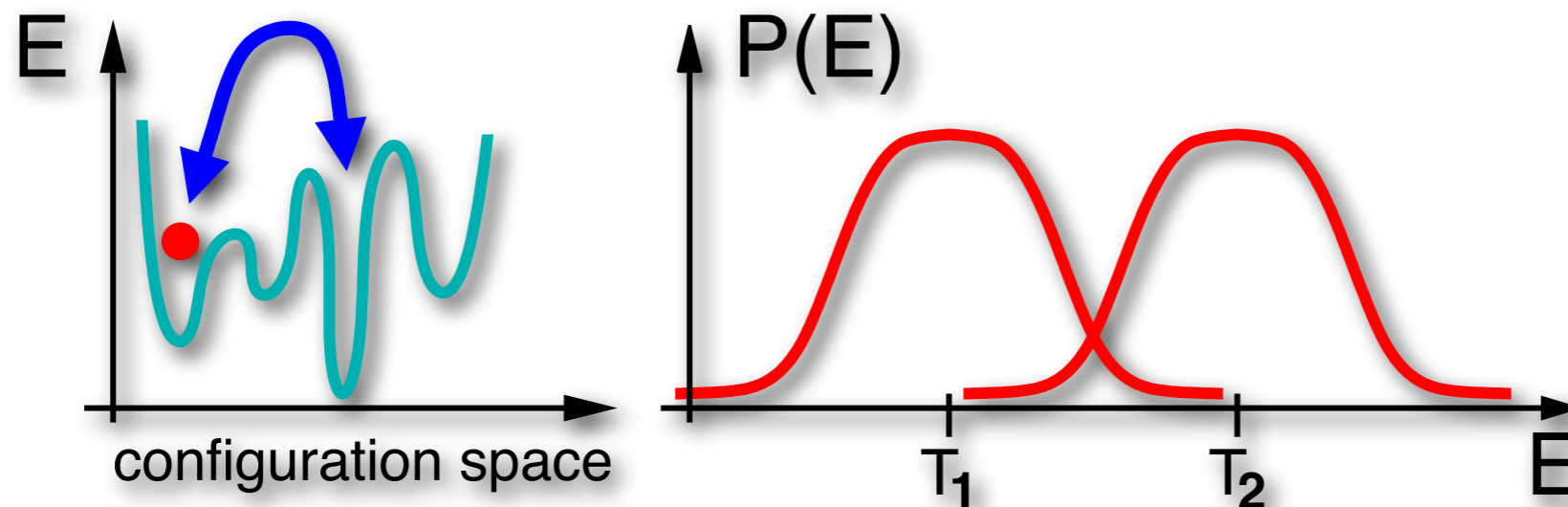
Exchange (parallel tempering) Monte Carlo

Hukushima & Nemoto (96)

- Efficient algorithm to treat spin glasses at finite T . Geyer (91)

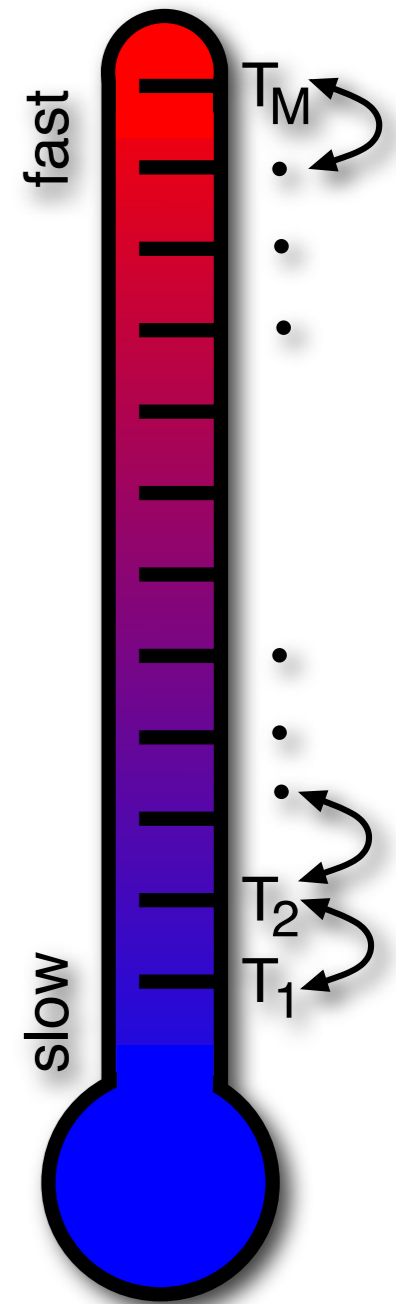
- **Idea:**

- Simulate M copies of the system at different temperatures with $T_{\max} > T_c$ (typically $T_{\max} \sim 2T_c^{\text{MF}}$).
- Allow swapping of neighboring temperatures: easy crossing of barriers. see, e.g., Katzgraber *et al.*, JSTAT (06)



- Extremely fast equilibration at low temperatures ($\sim 10^4$).
- Transition probabilities:

$$\mathcal{T}[(E_i, T_i) \rightarrow (E_{i+1}, T_{i+1})] = \min \{1, \exp[\Delta E_{i+1,i} \Delta \beta_{i+1,i}]\}$$



Back to bit-flip errors...

Probing criticality: correlation length

Cooper (82)

- Study the finite-size two-point correlation function.

- k -space susceptibility of the magnetization...

$$\chi(\mathbf{k}) = \frac{1}{N} \sum_{ij} \langle S^i S^j \rangle_T e^{i\mathbf{k}(\mathbf{R}_i - \mathbf{R}_j)}$$

- Perform an Ornstein-Zernicke approximation...

$$[\chi(k)/\chi(0)]^{-1} = 1 + \xi^2 k^2 + \mathcal{O}[(\xi k)^4]$$

- Compute the two-point correlation function:

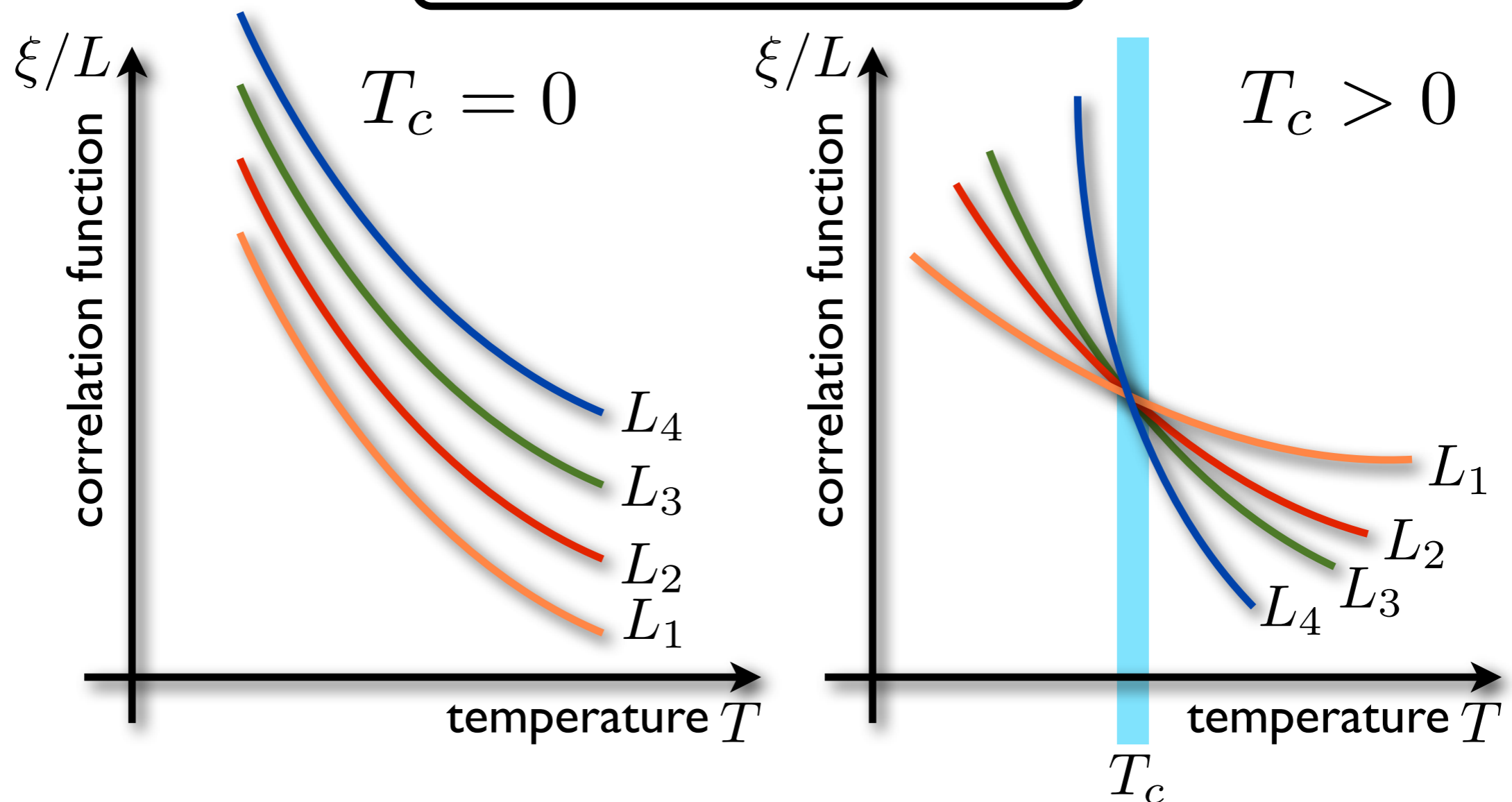
$$\xi = \frac{1}{2 \sin(k_{\min}/2)} \sqrt{\frac{[\chi(0)]_{\text{av}}}{[\chi(k_{\min})]_{\text{av}}} - 1}$$

Probing criticality: correlation length

Cooper (82)

- Study the finite-size two-point correlation function.
- Scaling behavior:

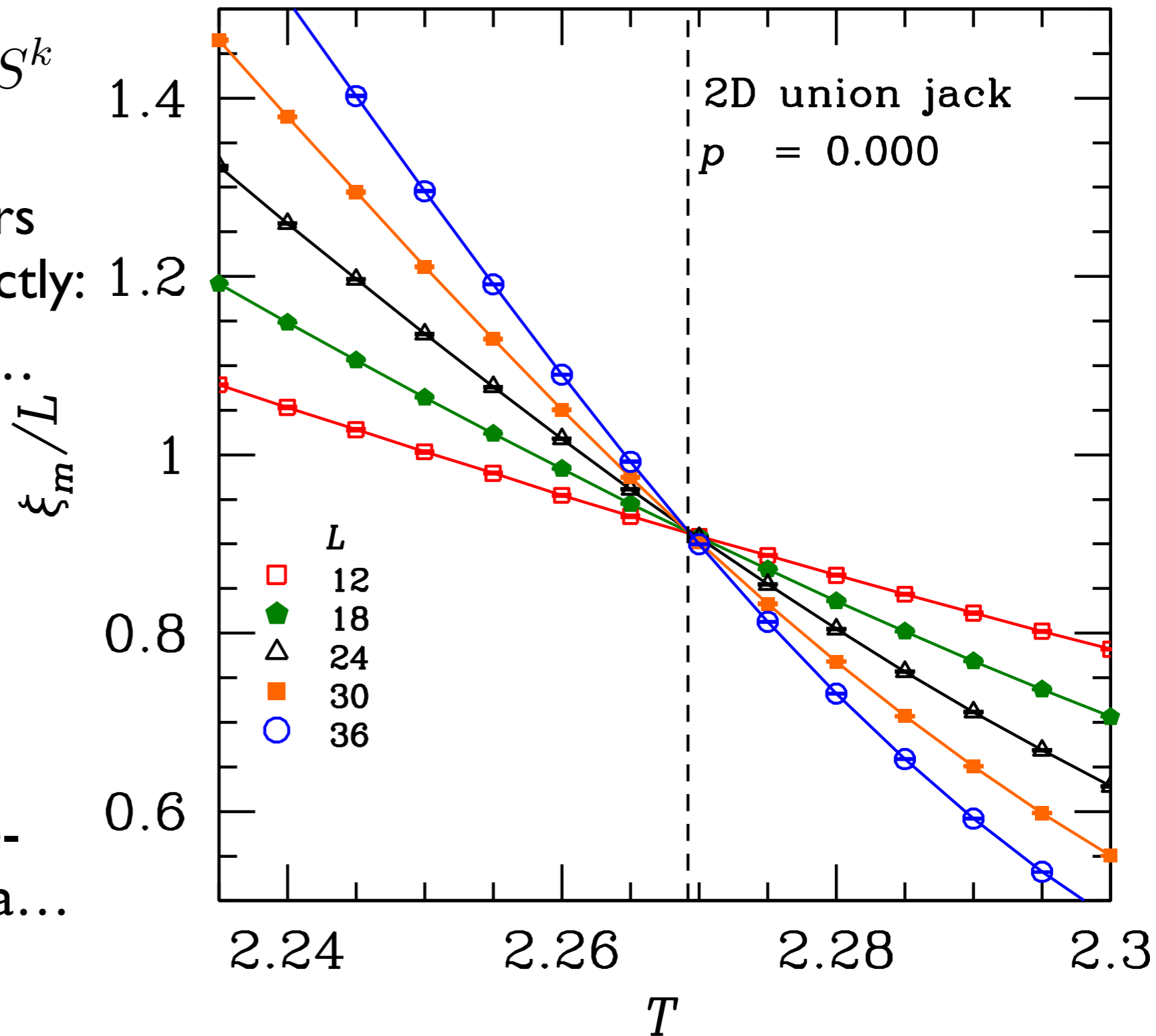
$$\frac{\xi}{L} = \tilde{X} \left(L^{1/\nu} [T - T_c] \right)$$



Benchmark case: $p = 0$

$$\mathcal{H} = J \sum_{\langle ijk \rangle} \tau_{ijk} S^i S^j S^k$$

- The critical parameters can be computed exactly:
 - $T_c = T_c^{\text{ising}} = 2.269\dots$
 - $\nu = 3/4$
 - $\alpha = 1/2$
- Agreement with exact results.
- **Next:** Perform a finite-size scaling of the data...



Scaling with known exponents ($p = 0$)

- **Fixed parameters:**

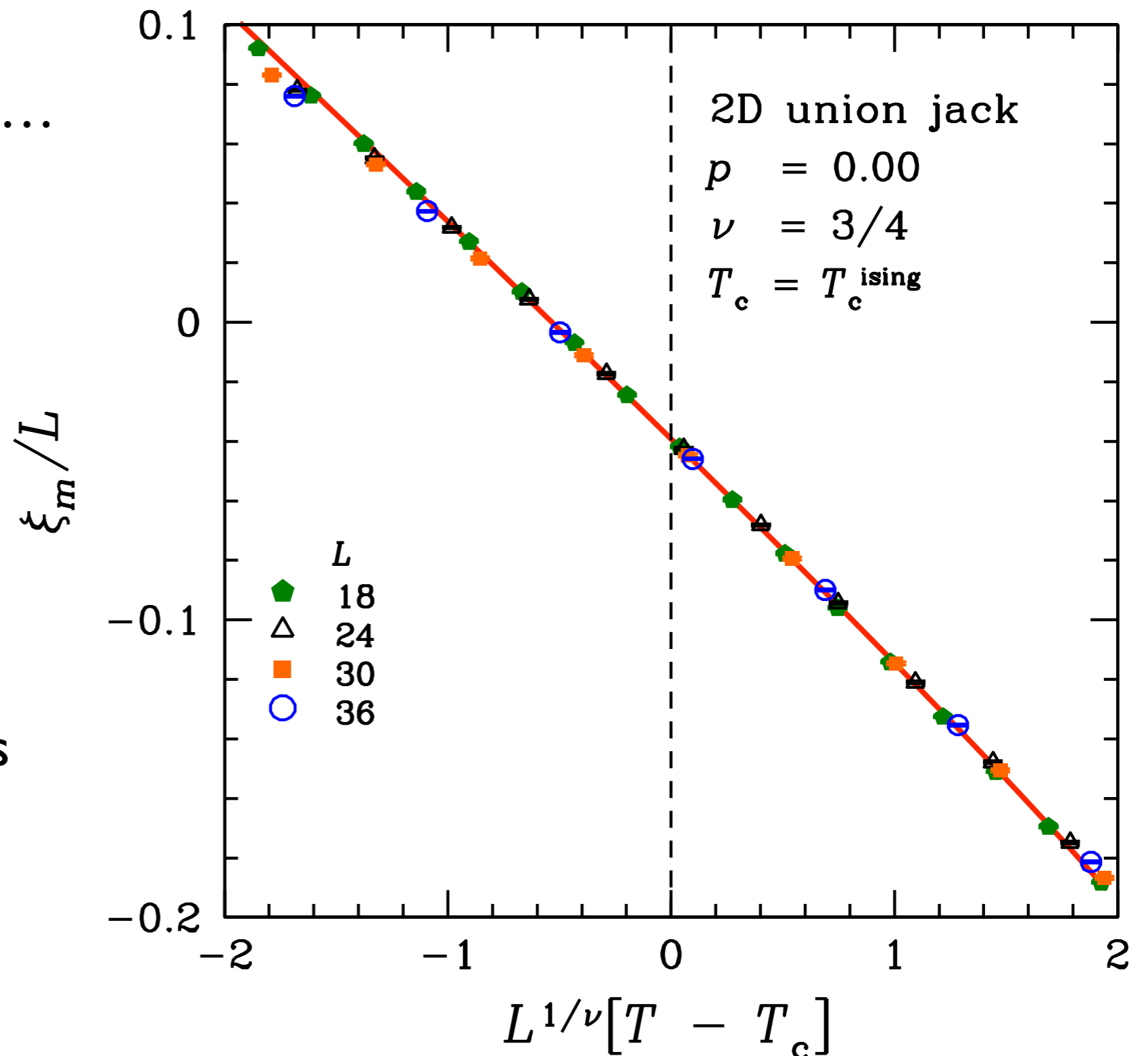
- $T_c = T_c^{\text{ising}} = 2.269\dots$

- $\nu = 3/4$

- The finite-size scaling is perfect.

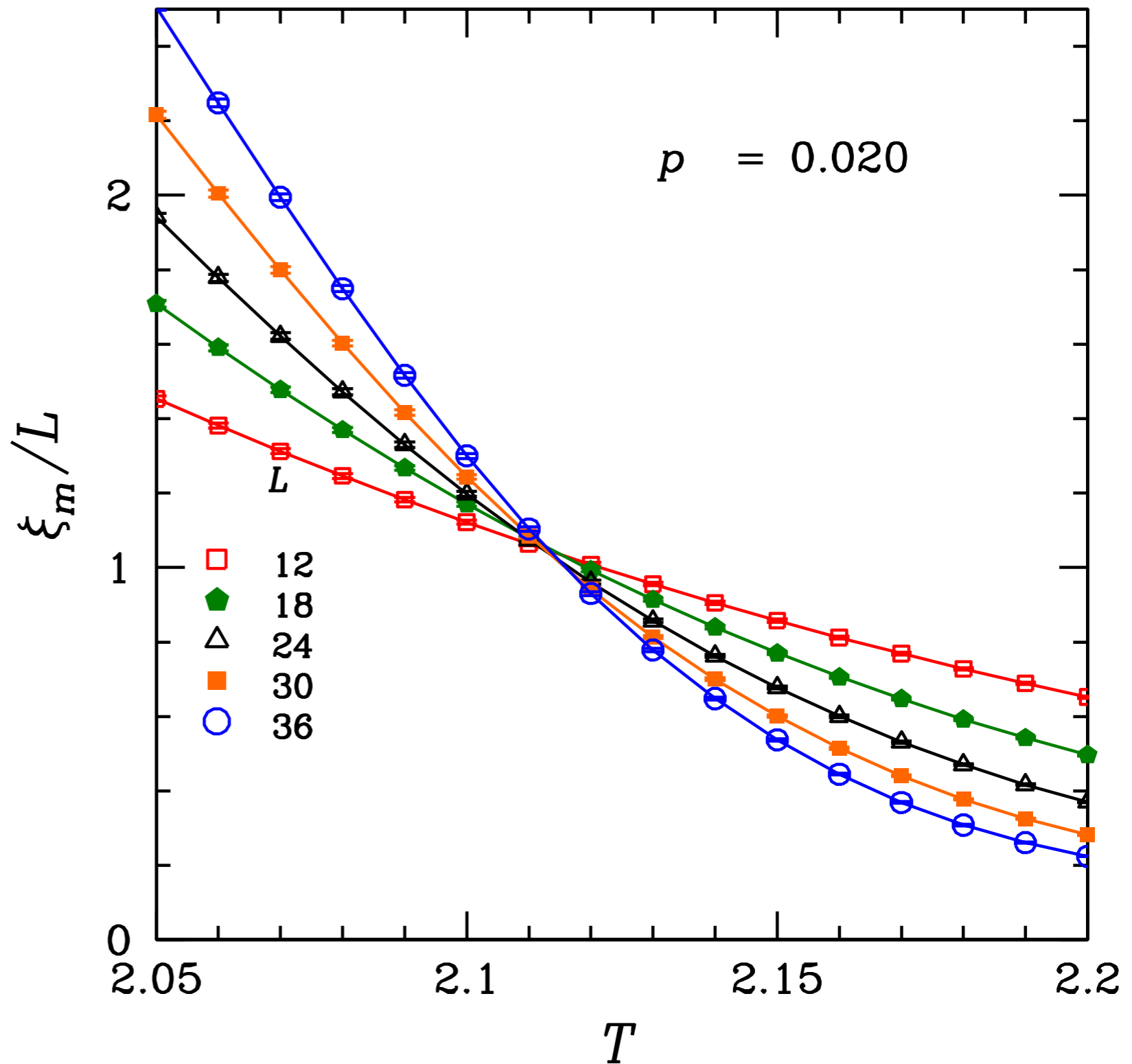
- **Next:** introduce errors by flipping bits

$$\tau_{ijk} \rightarrow -\tau_{ijk}$$



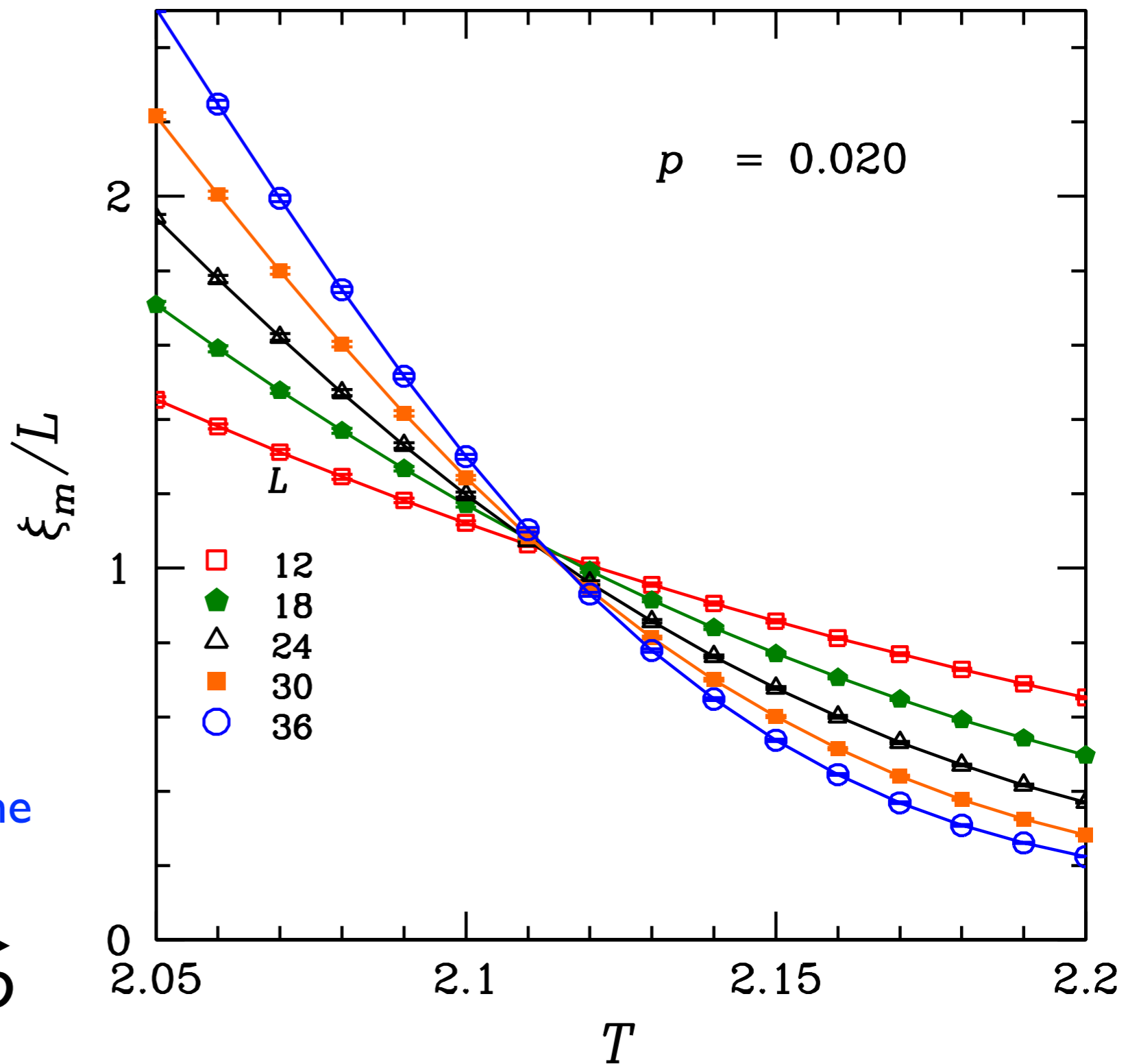
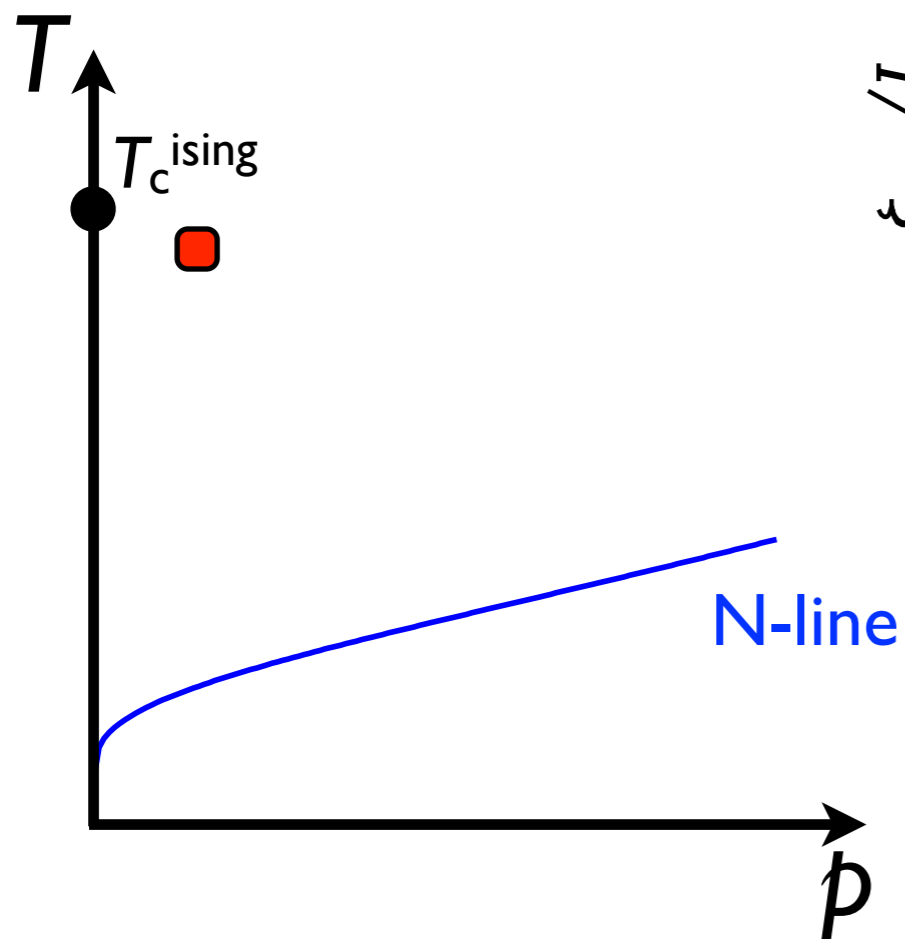
Introduce qubit errors with $p > 0$

- For each value of p compute T_c .
- Corrections around $p \sim 0.108$.



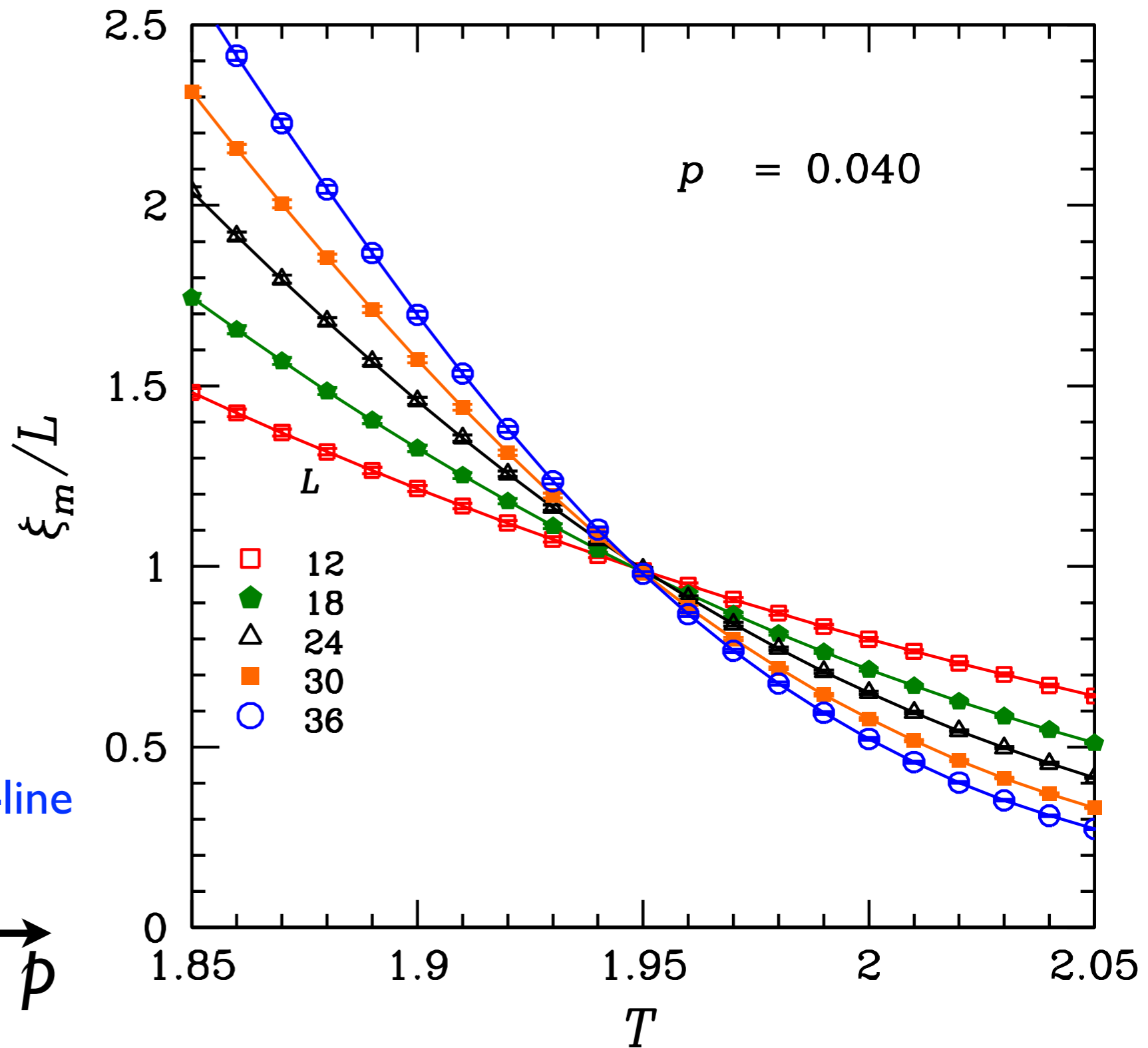
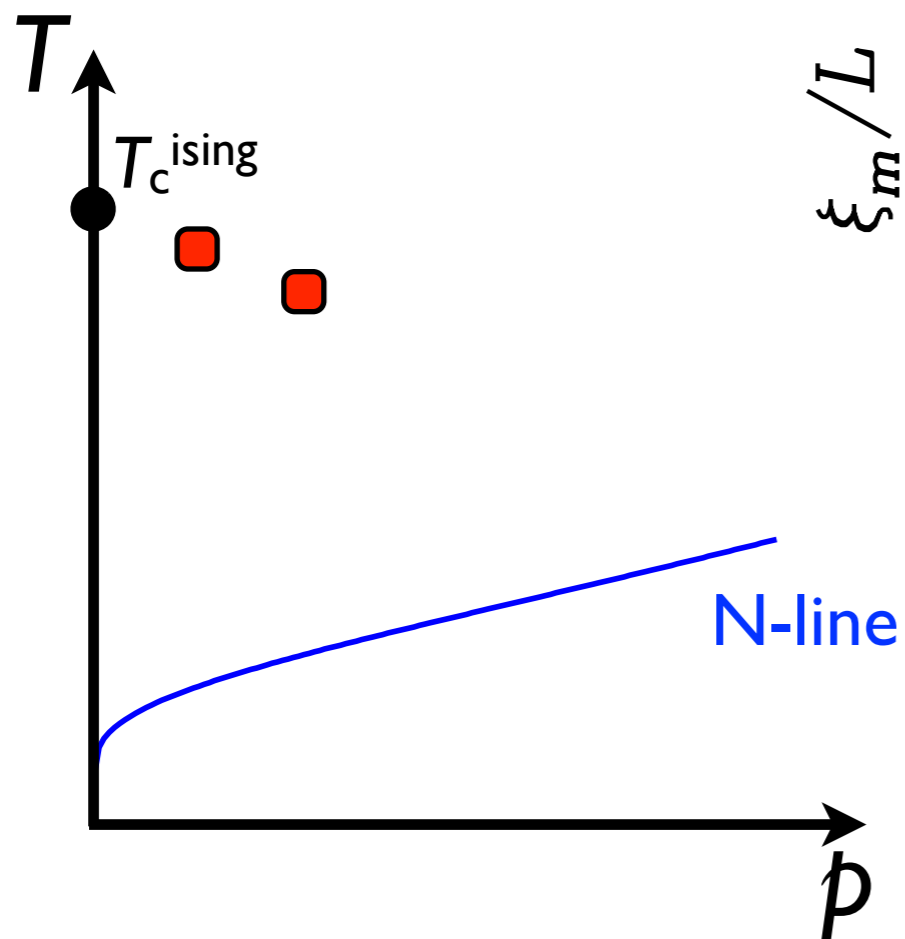
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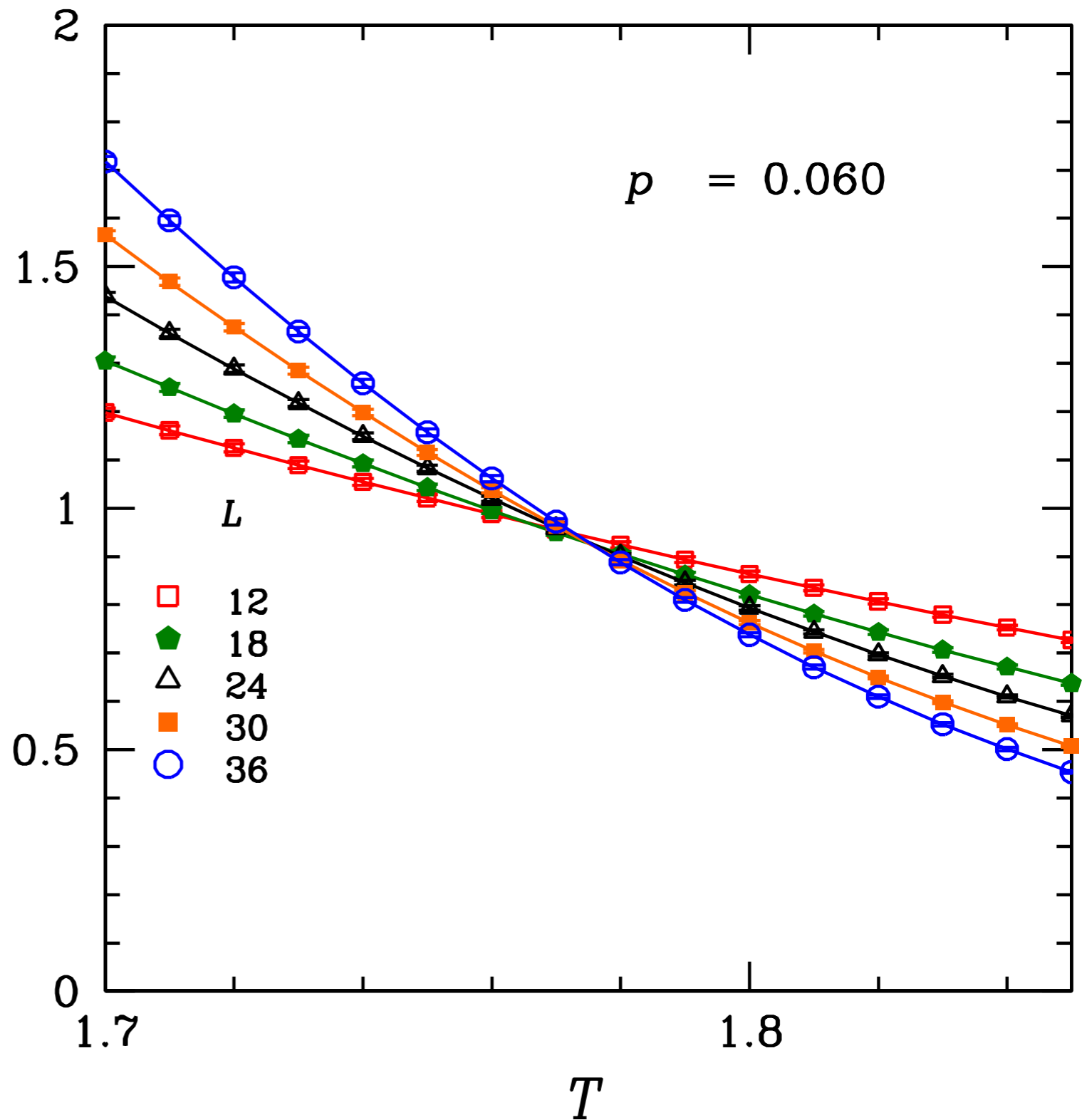
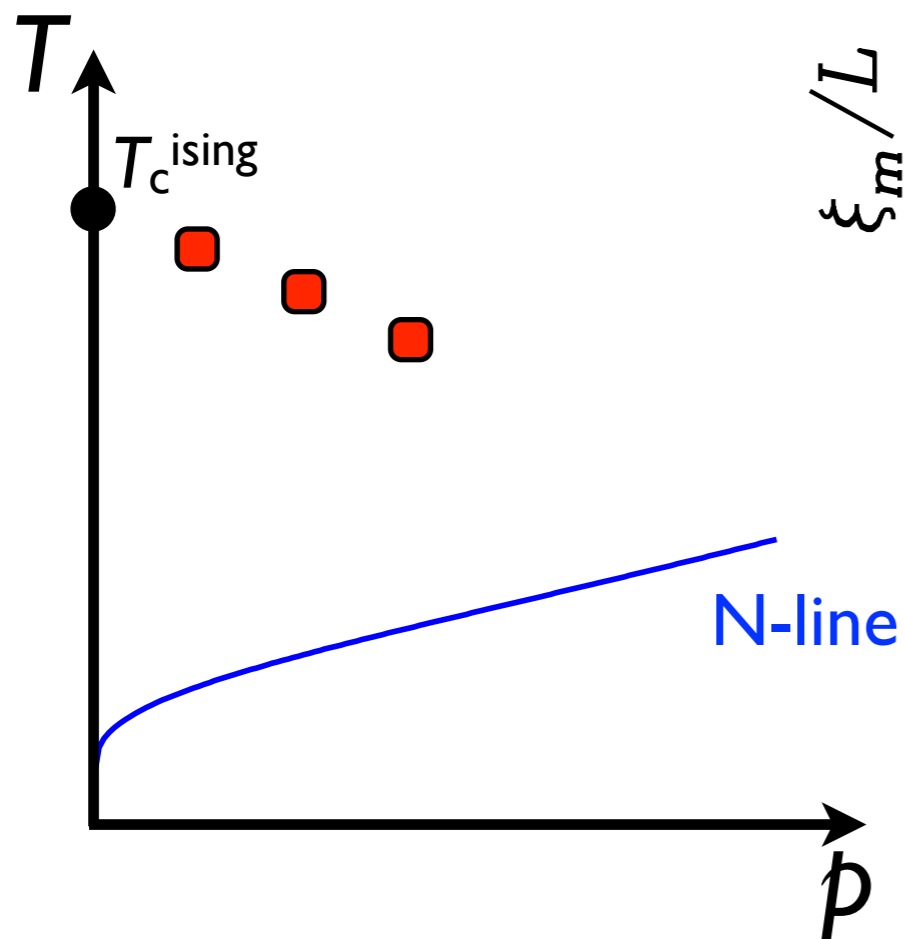
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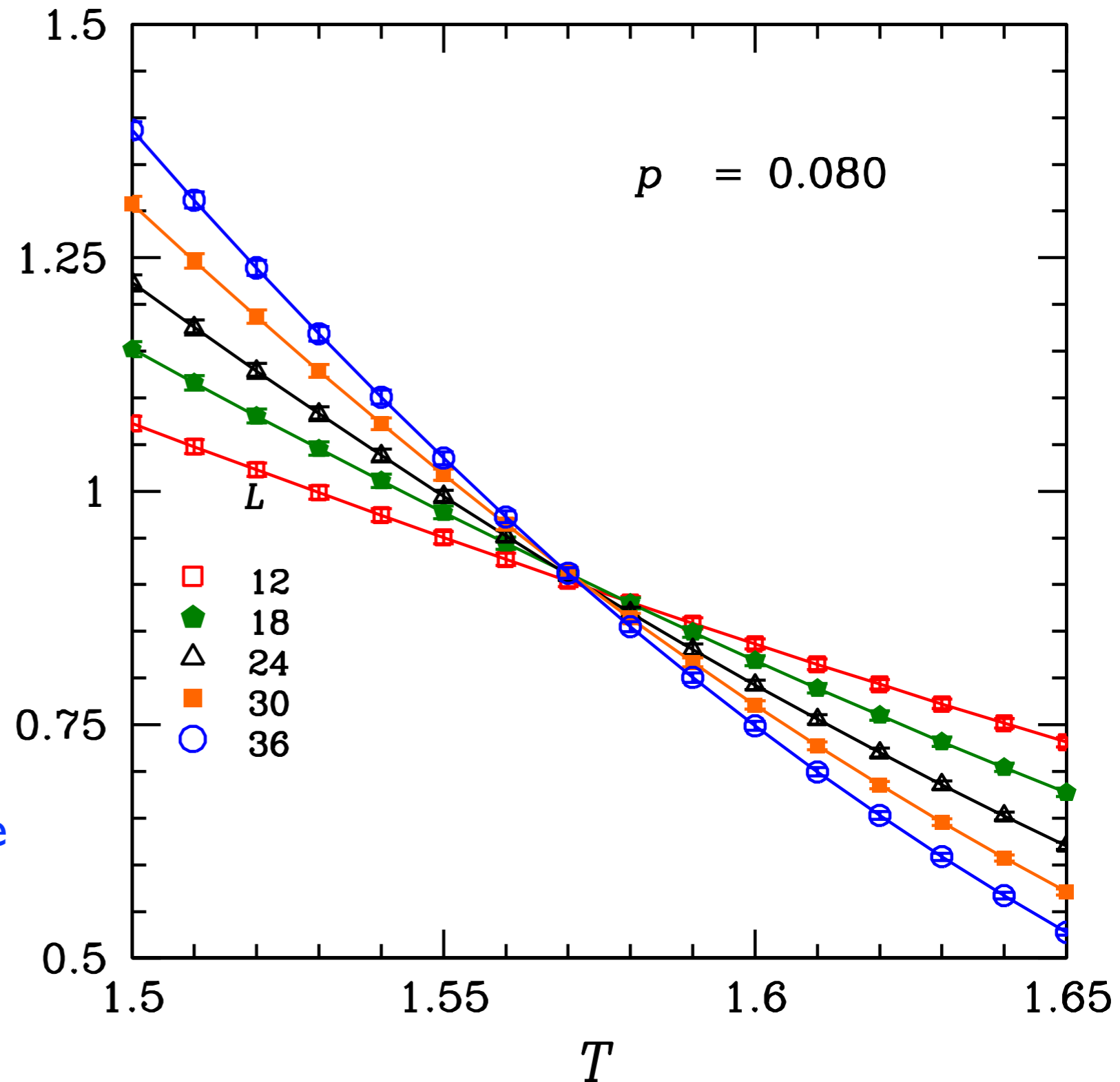
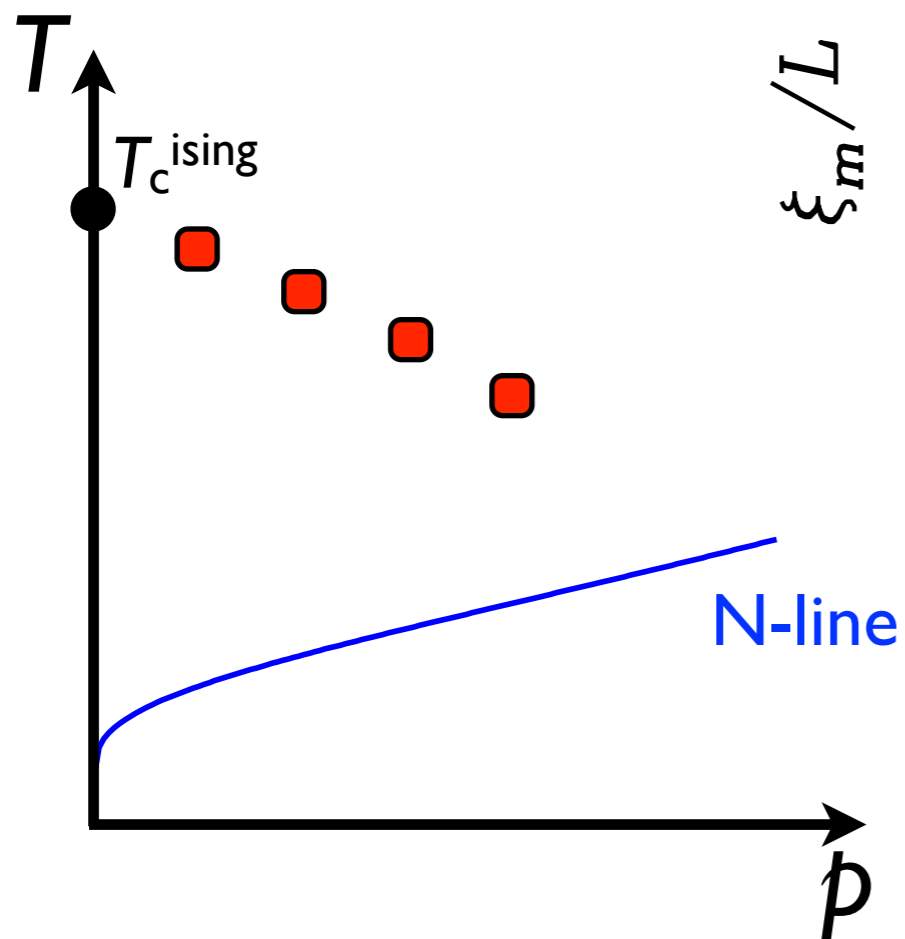
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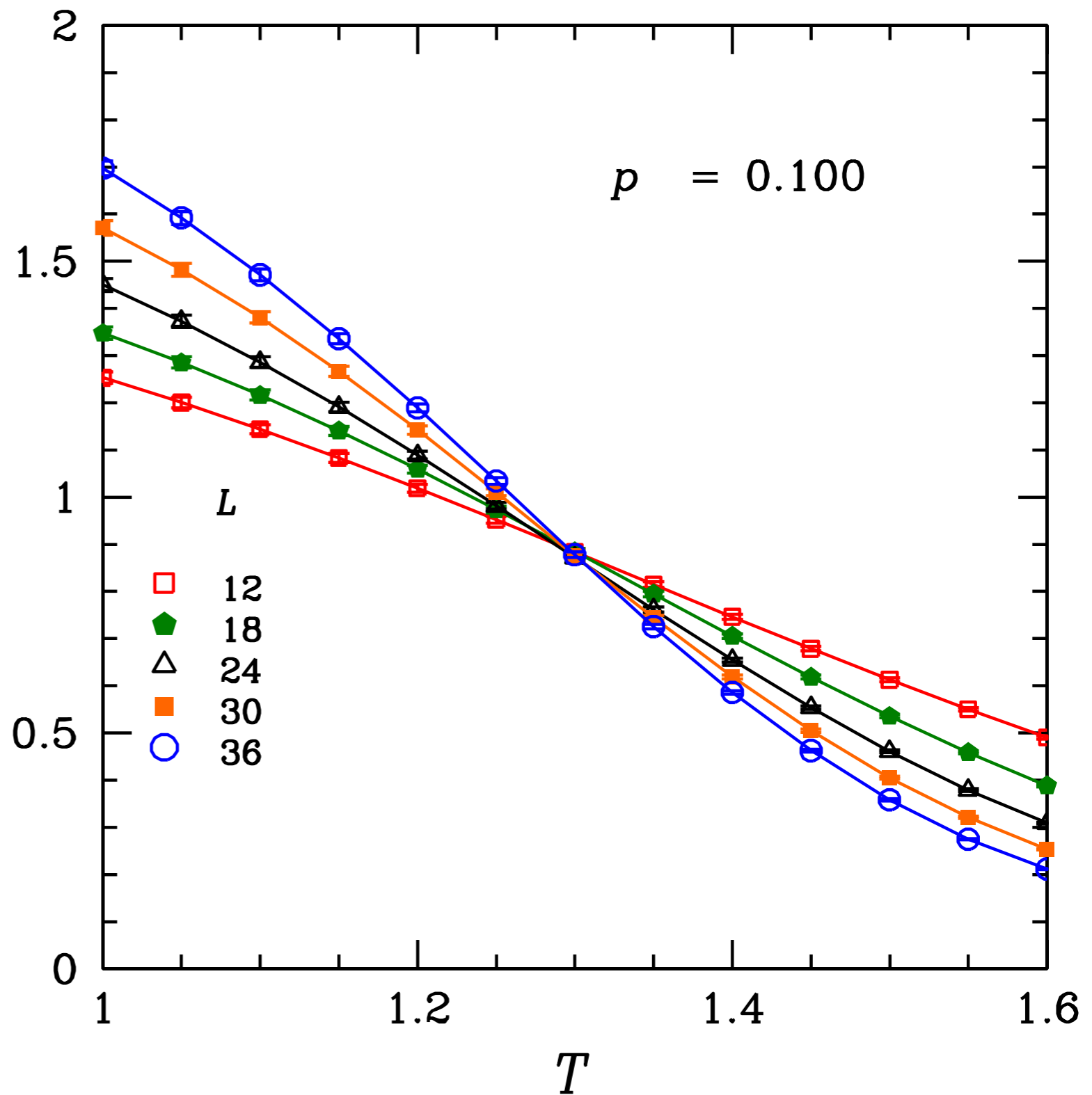
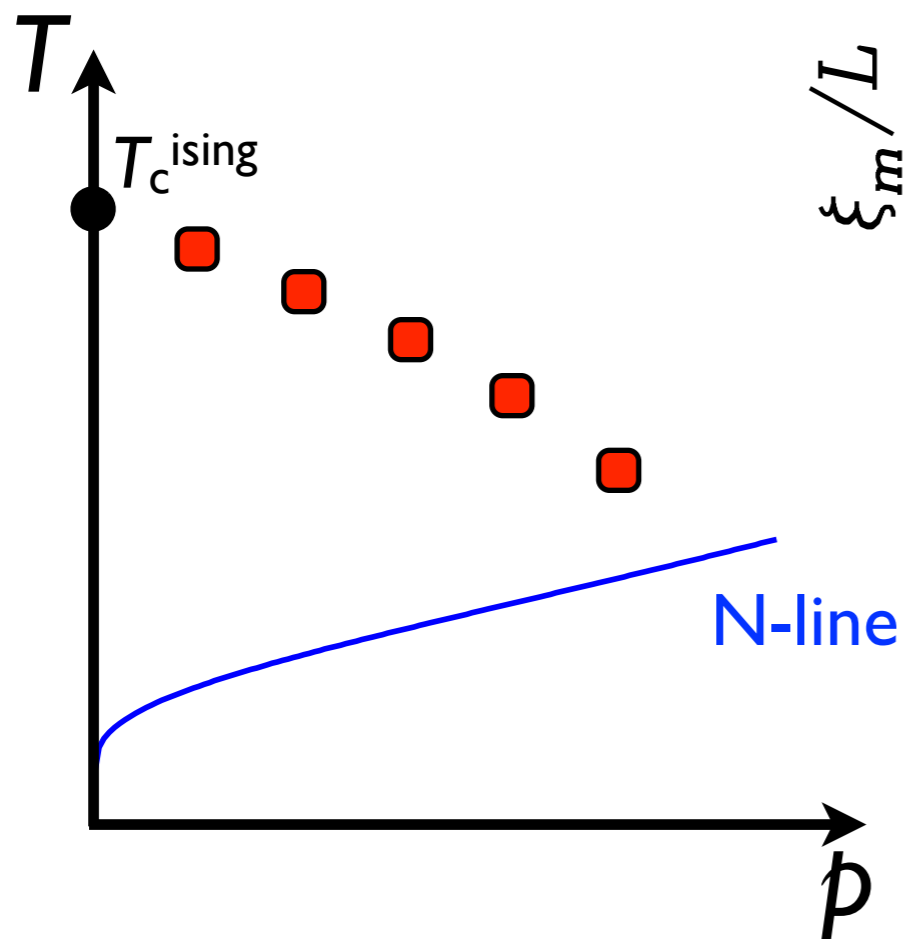
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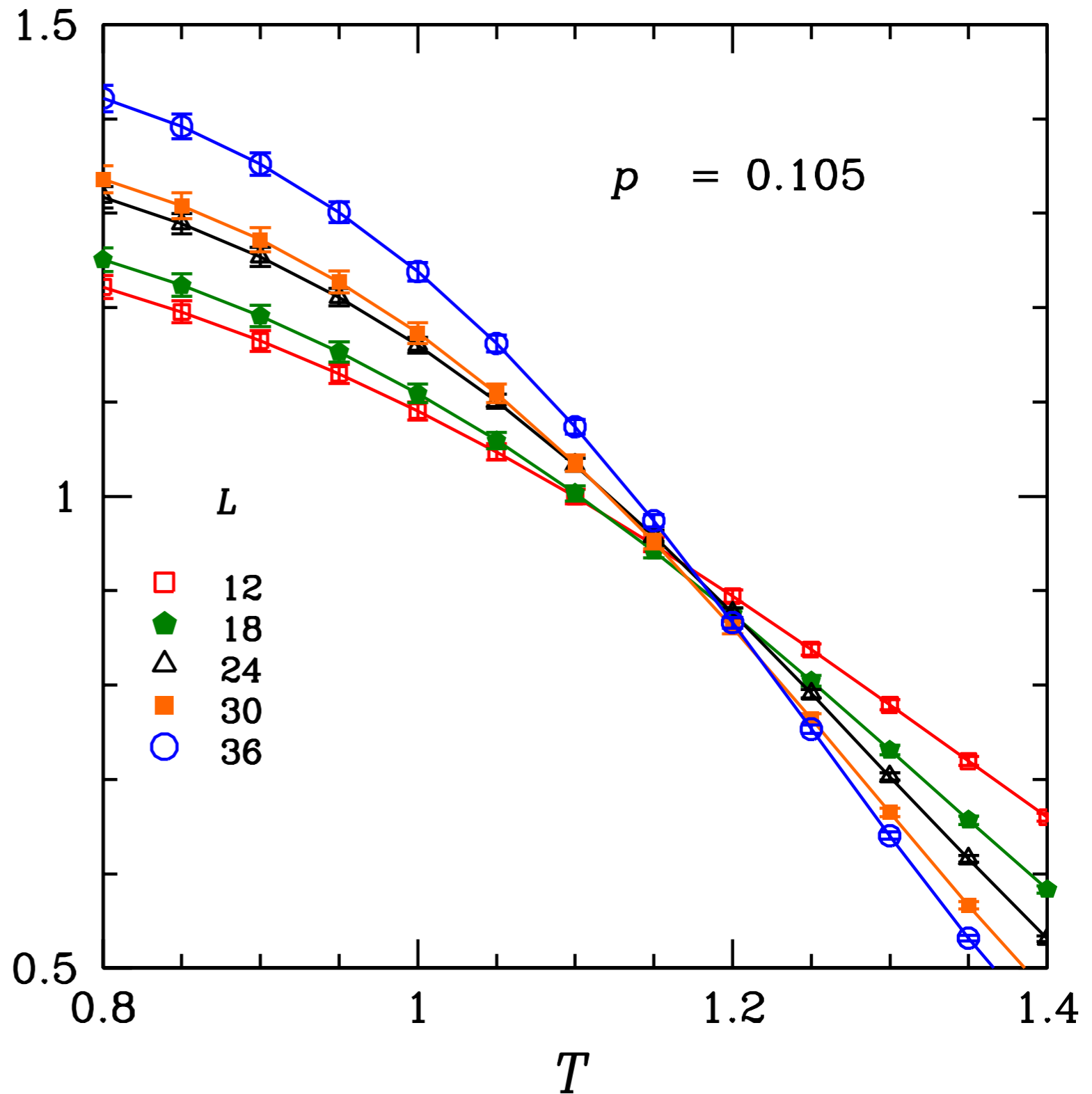
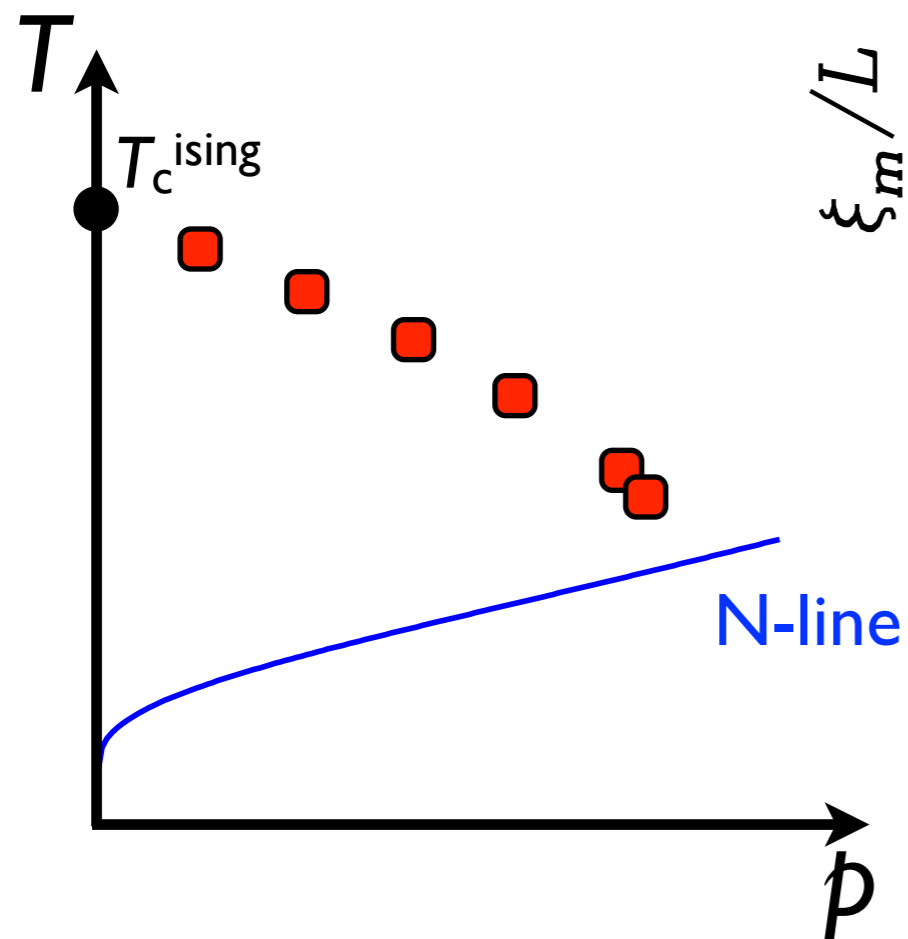
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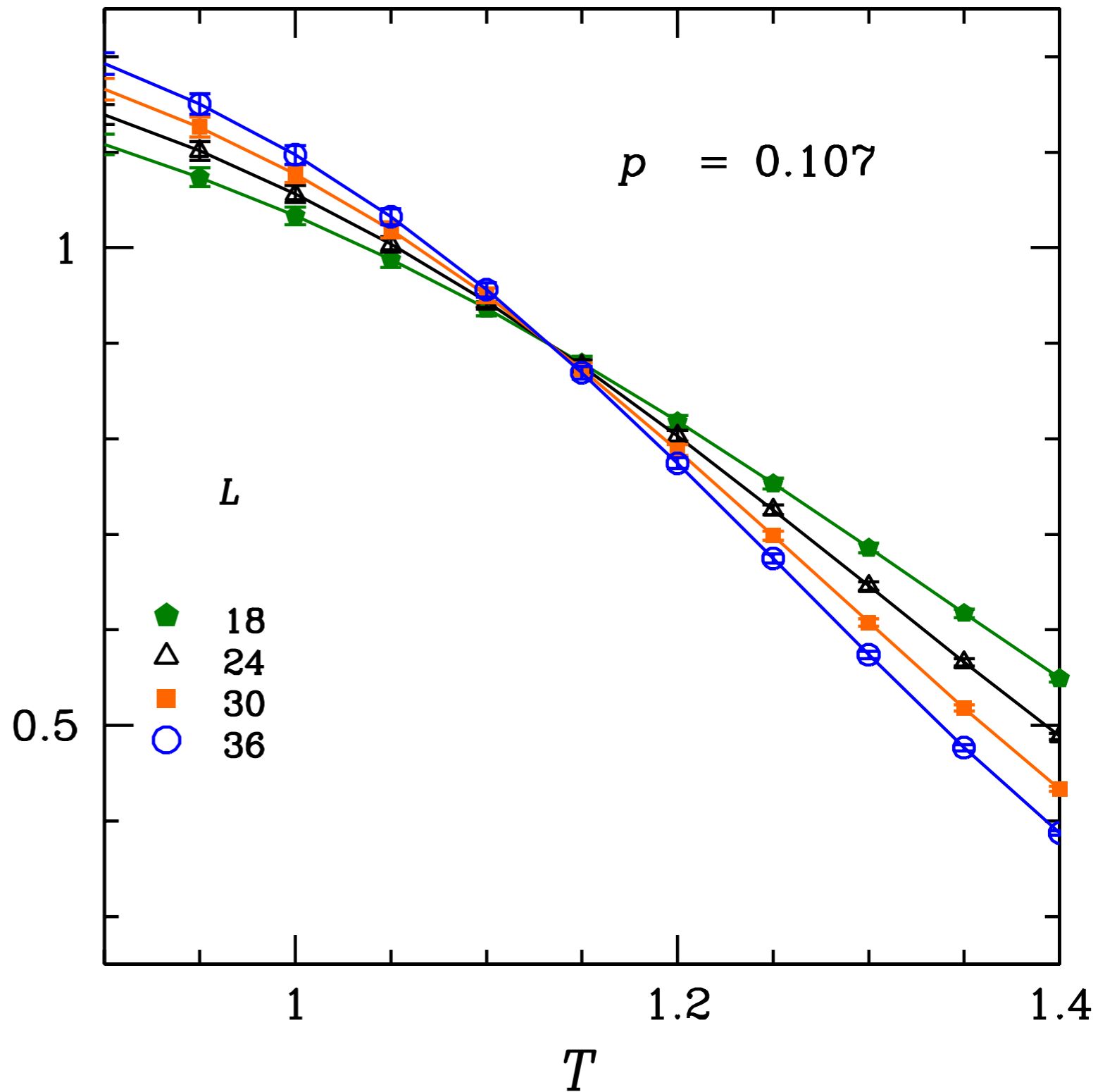
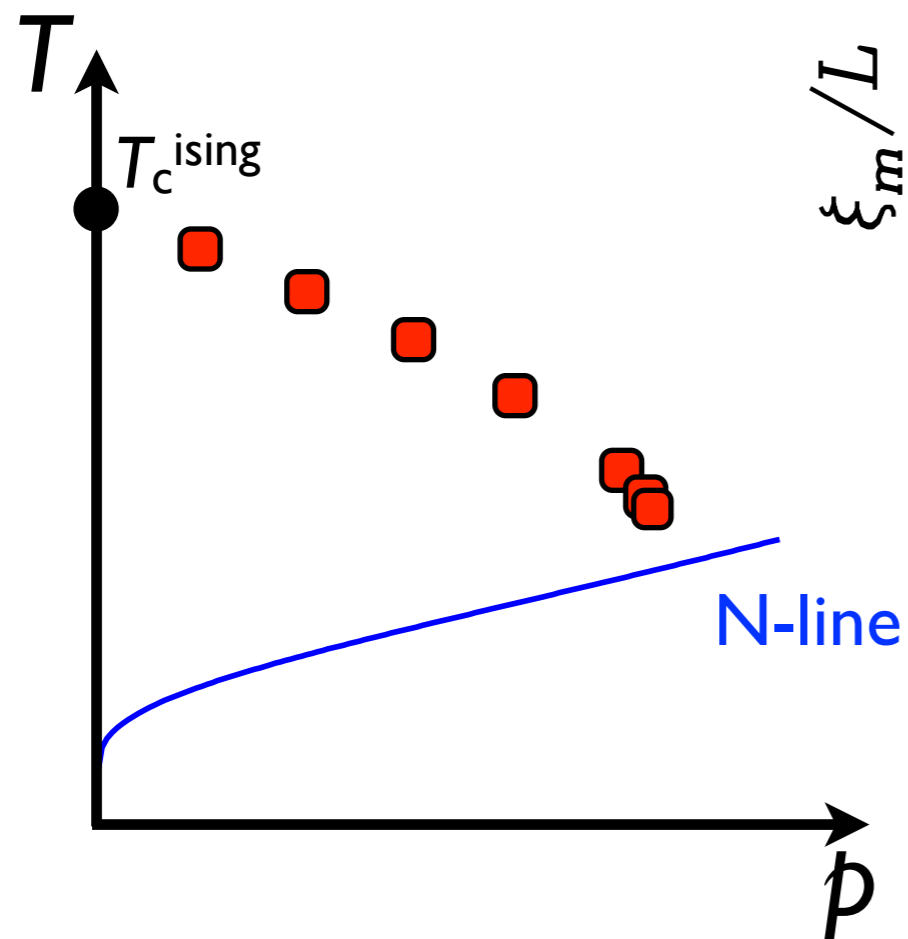
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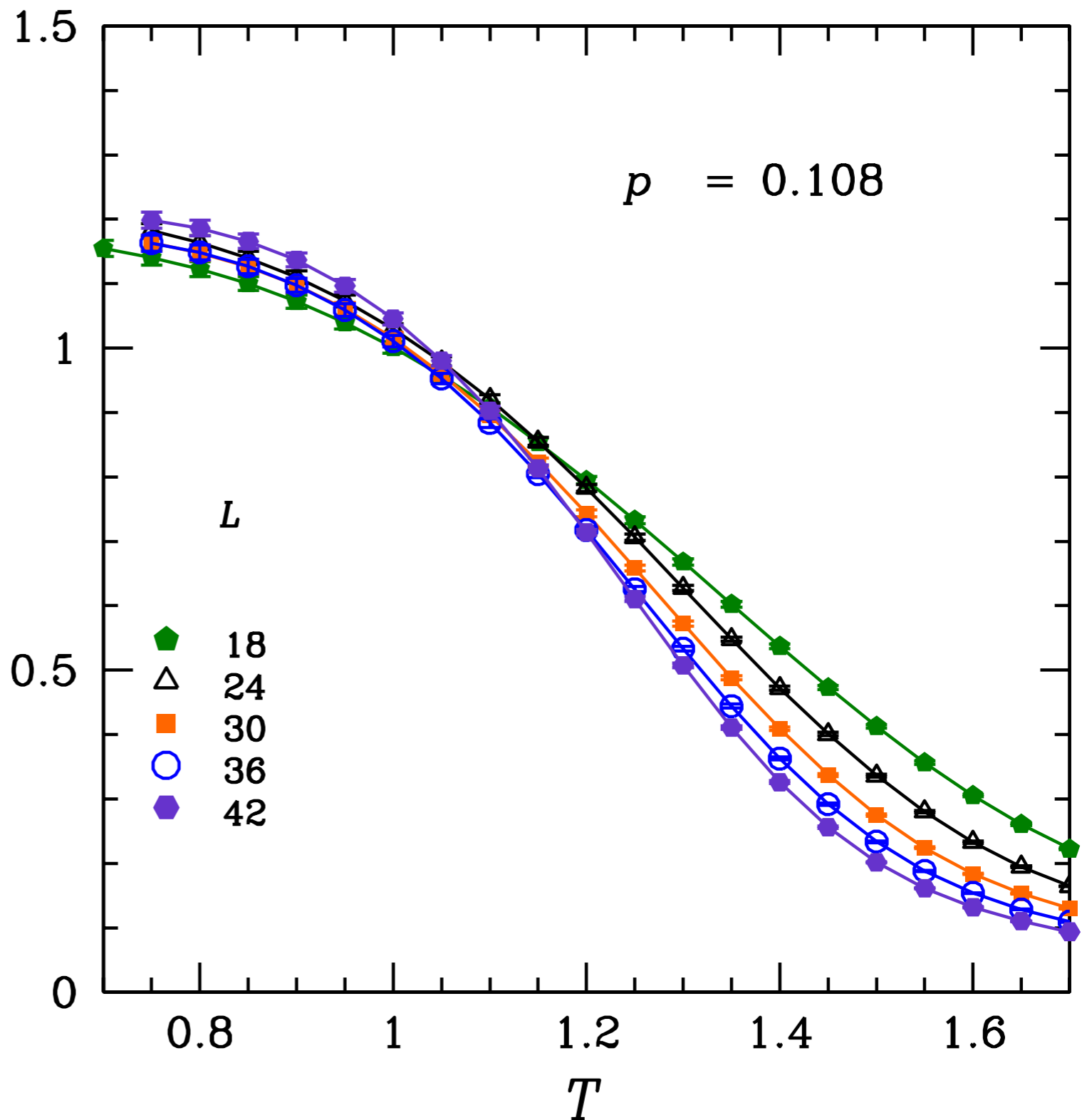
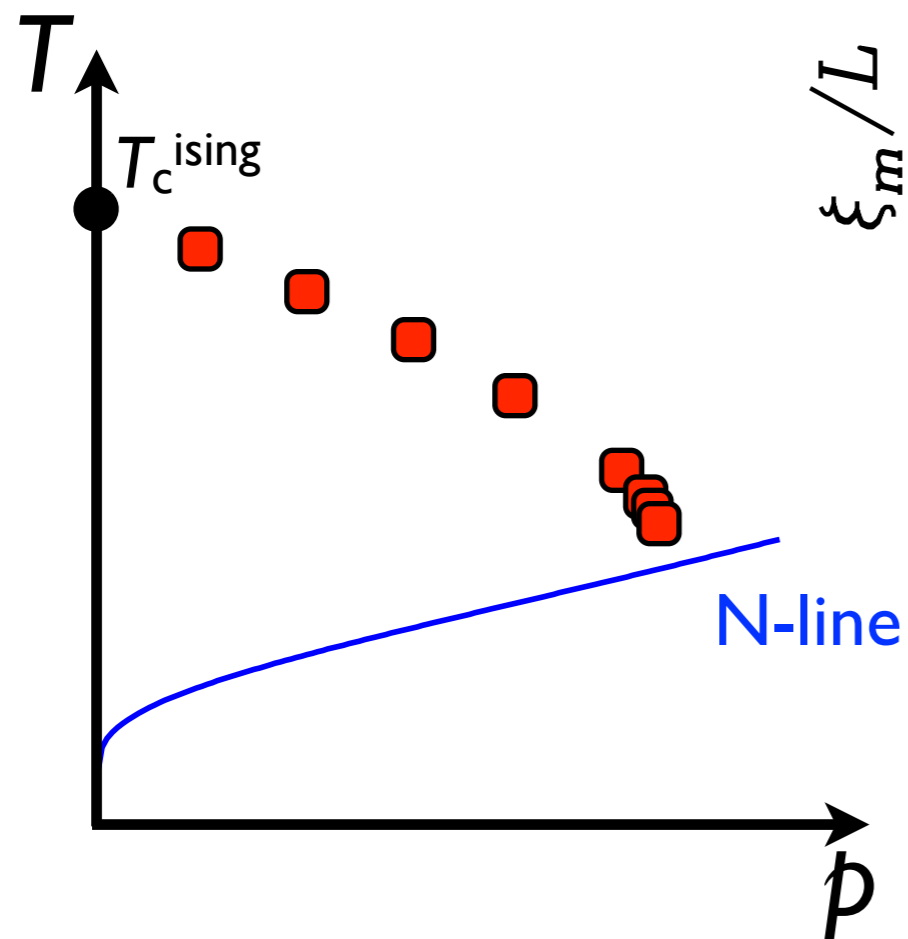
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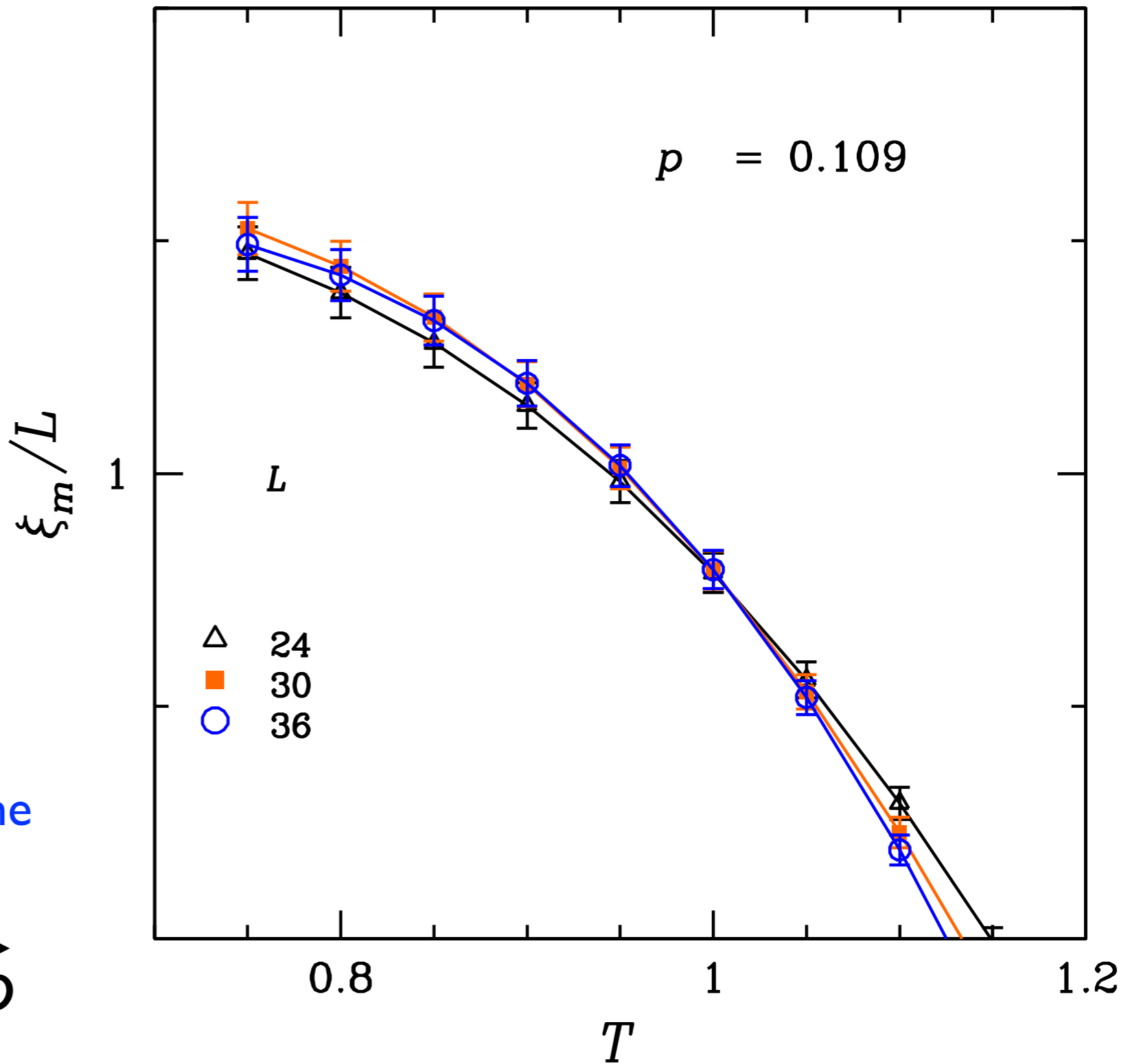
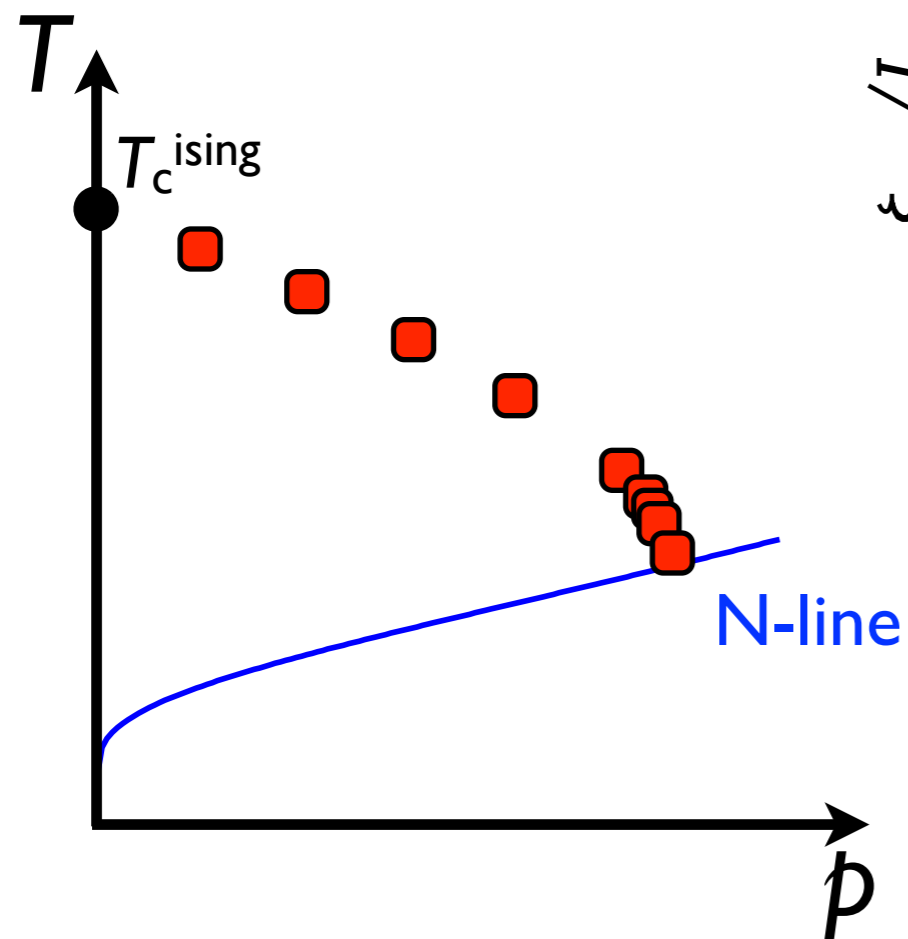
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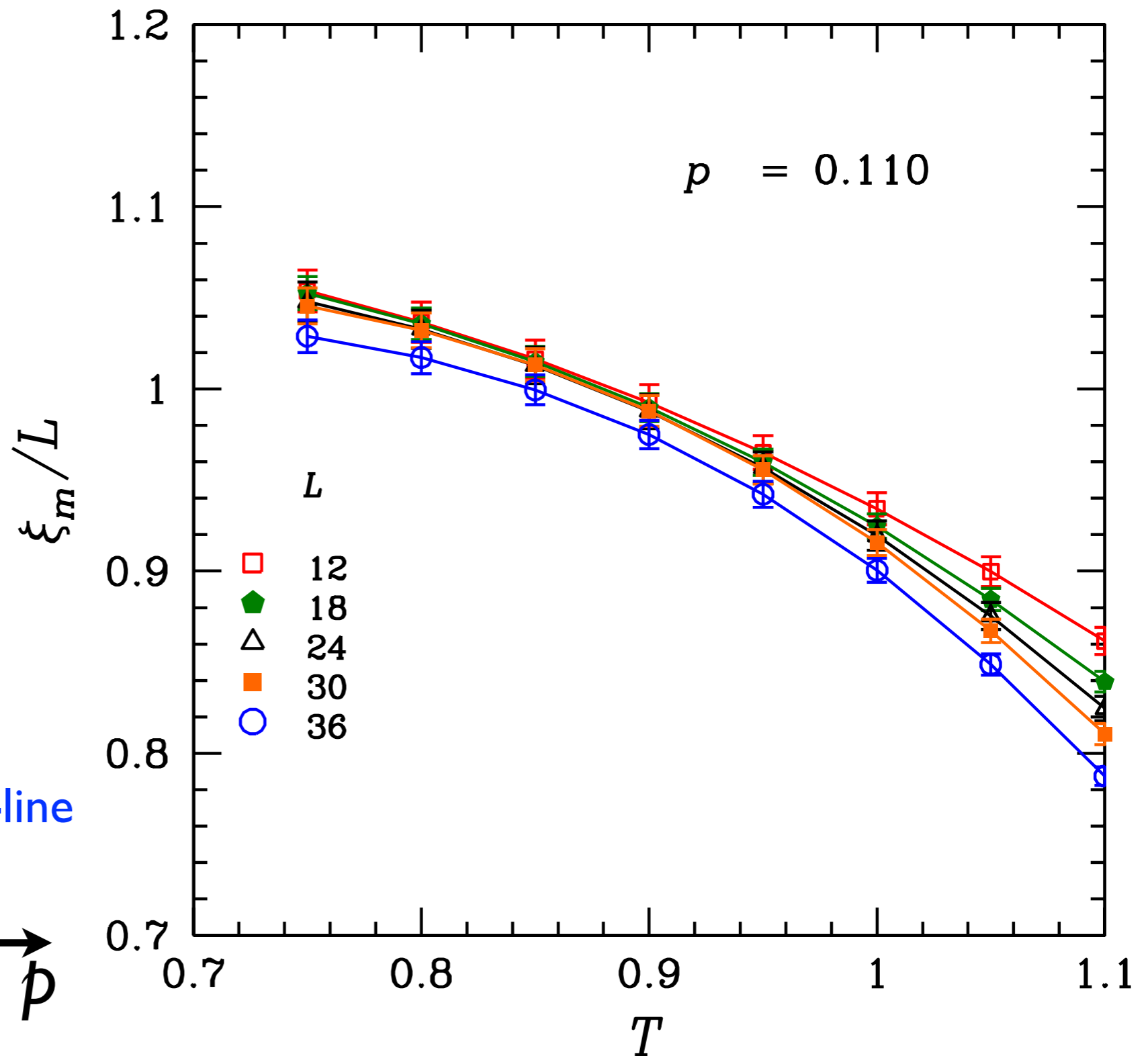
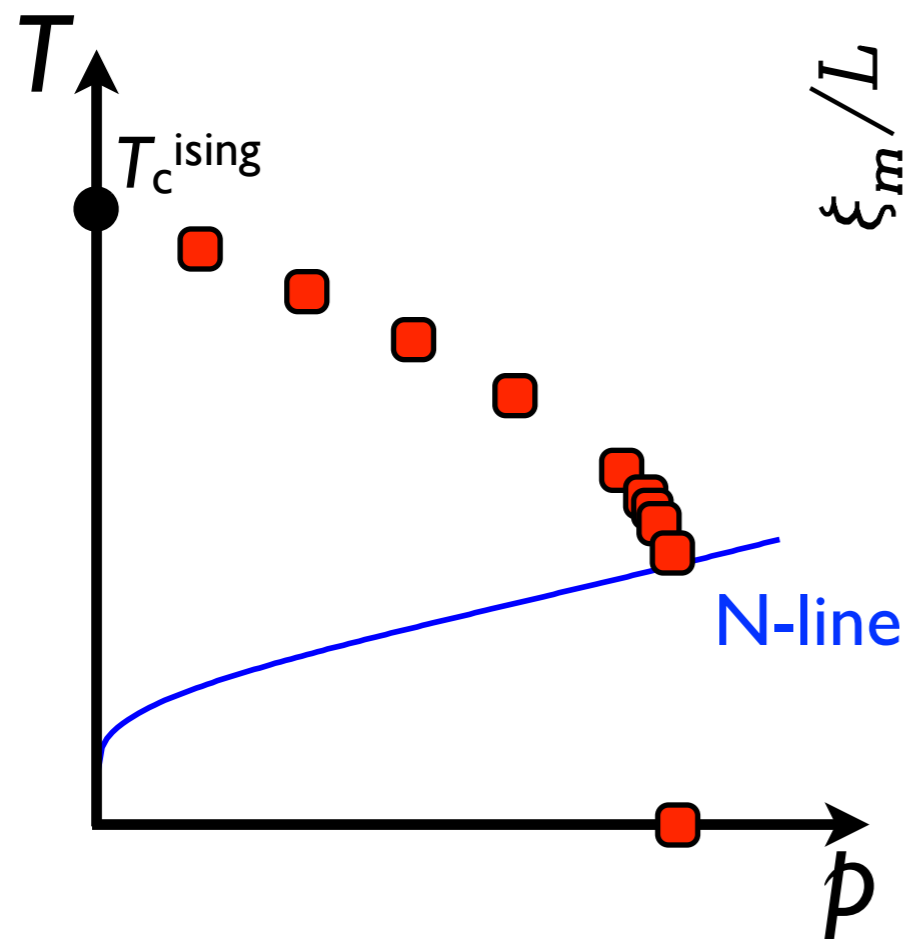
Introduce qubit errors with $p > 0$

- For each value of p compute T_c .
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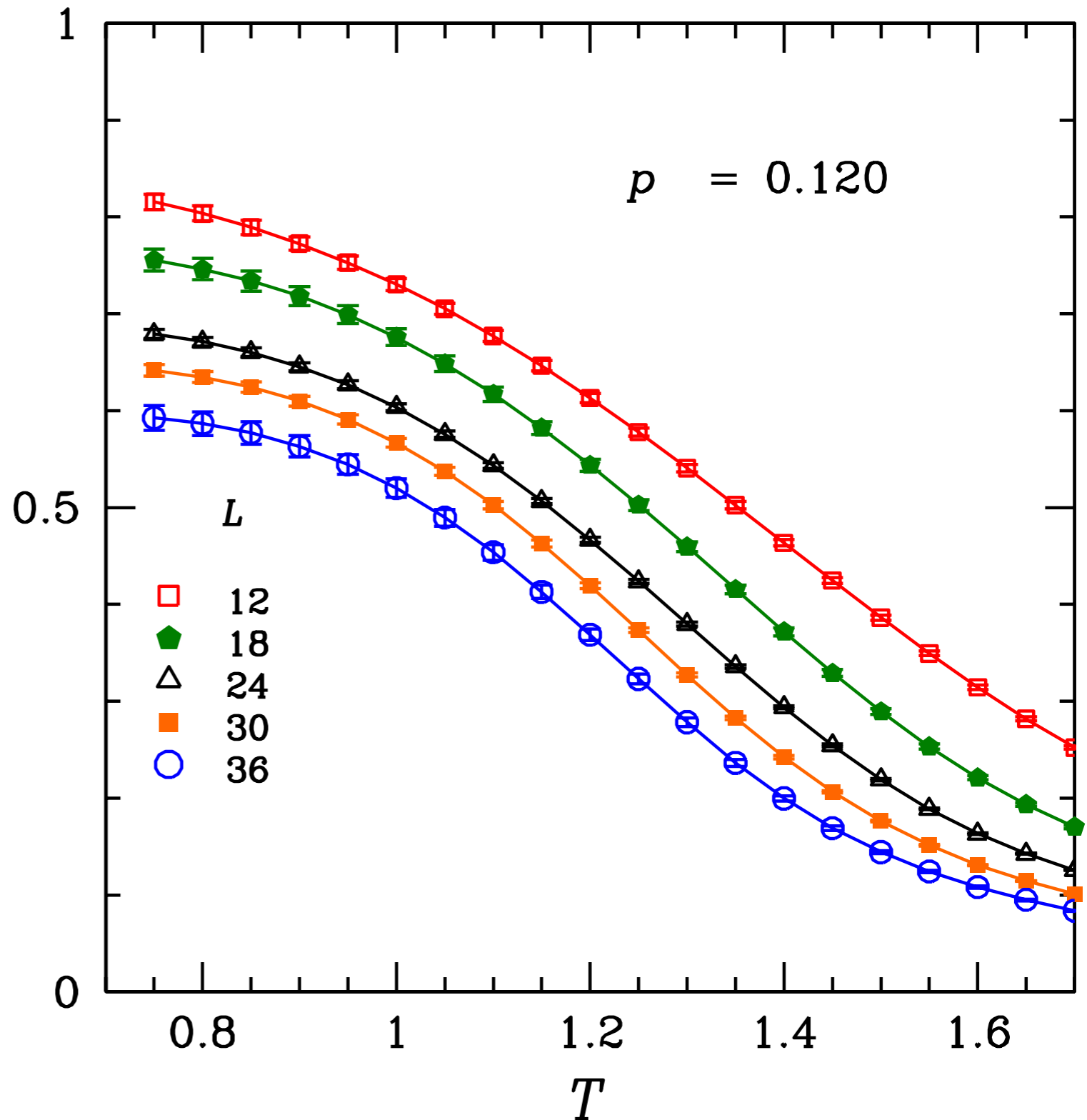
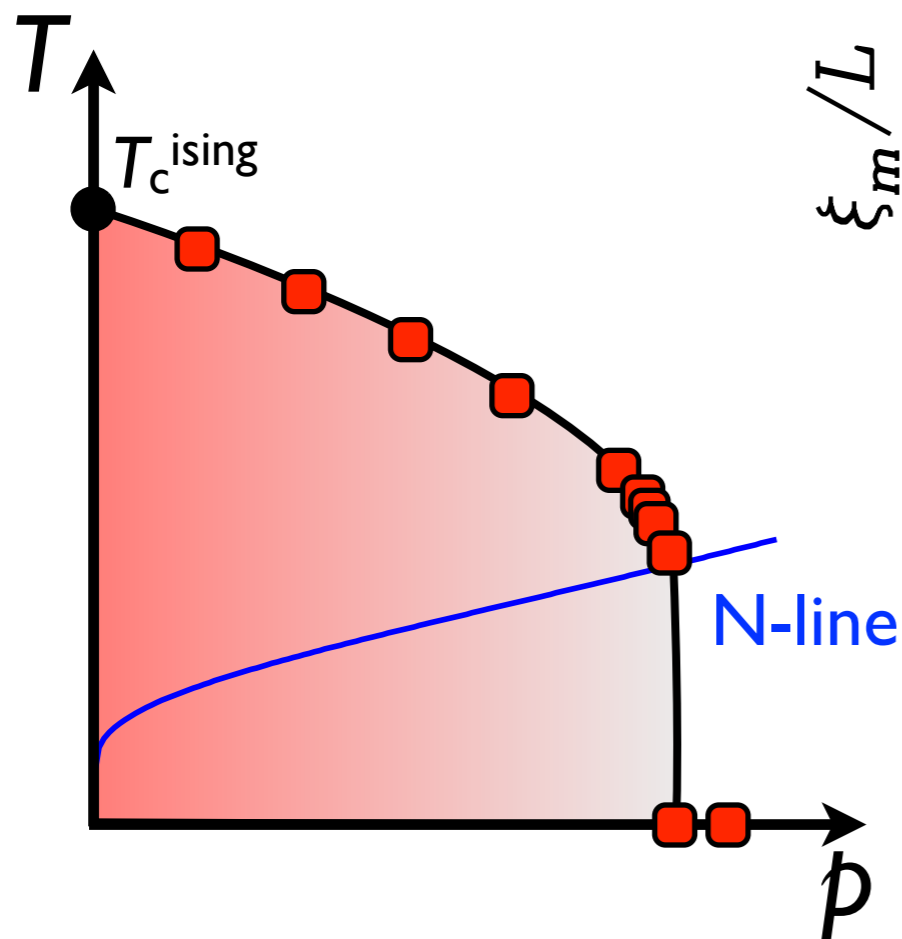
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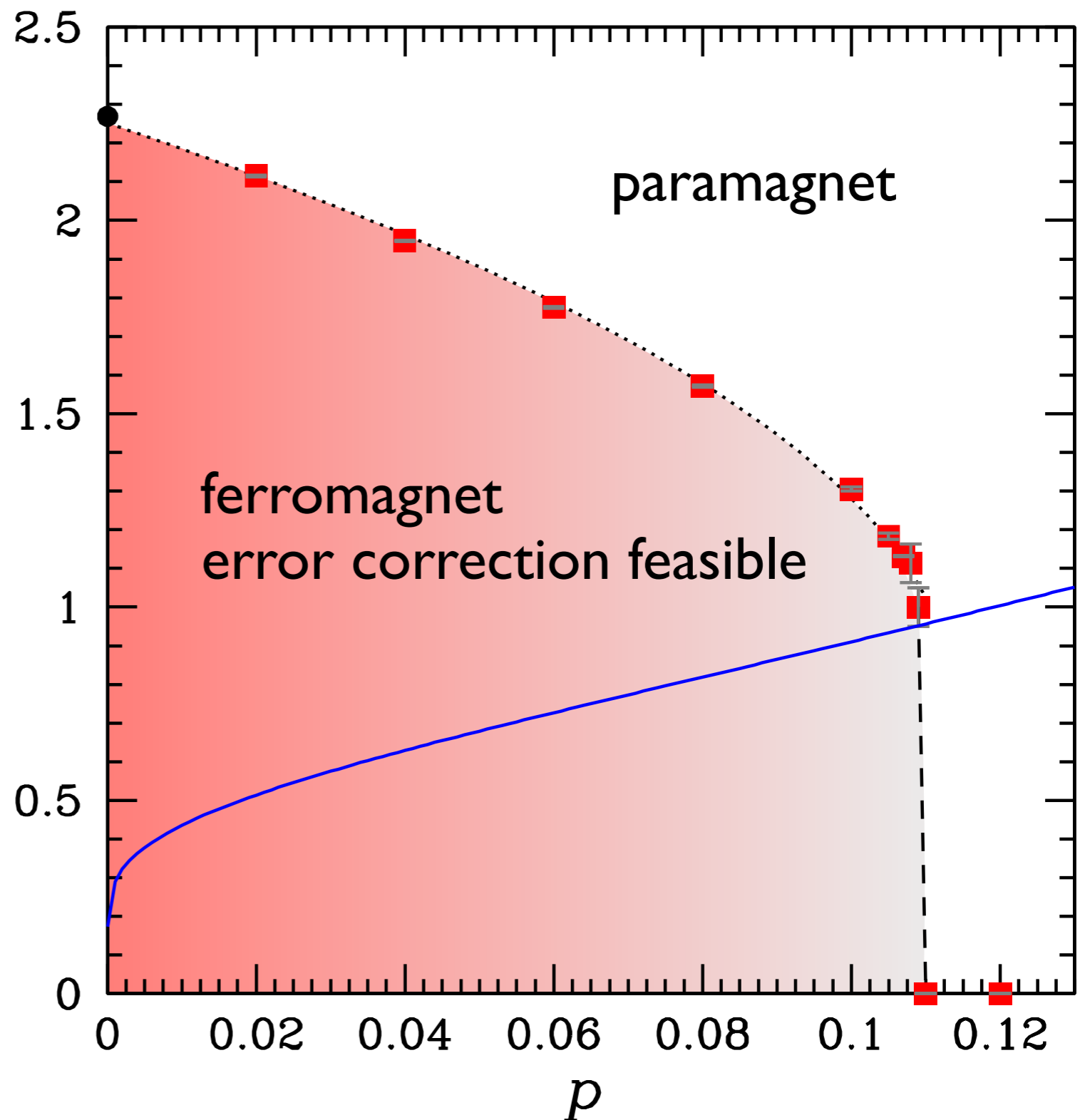
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p - T phase diagram & error threshold

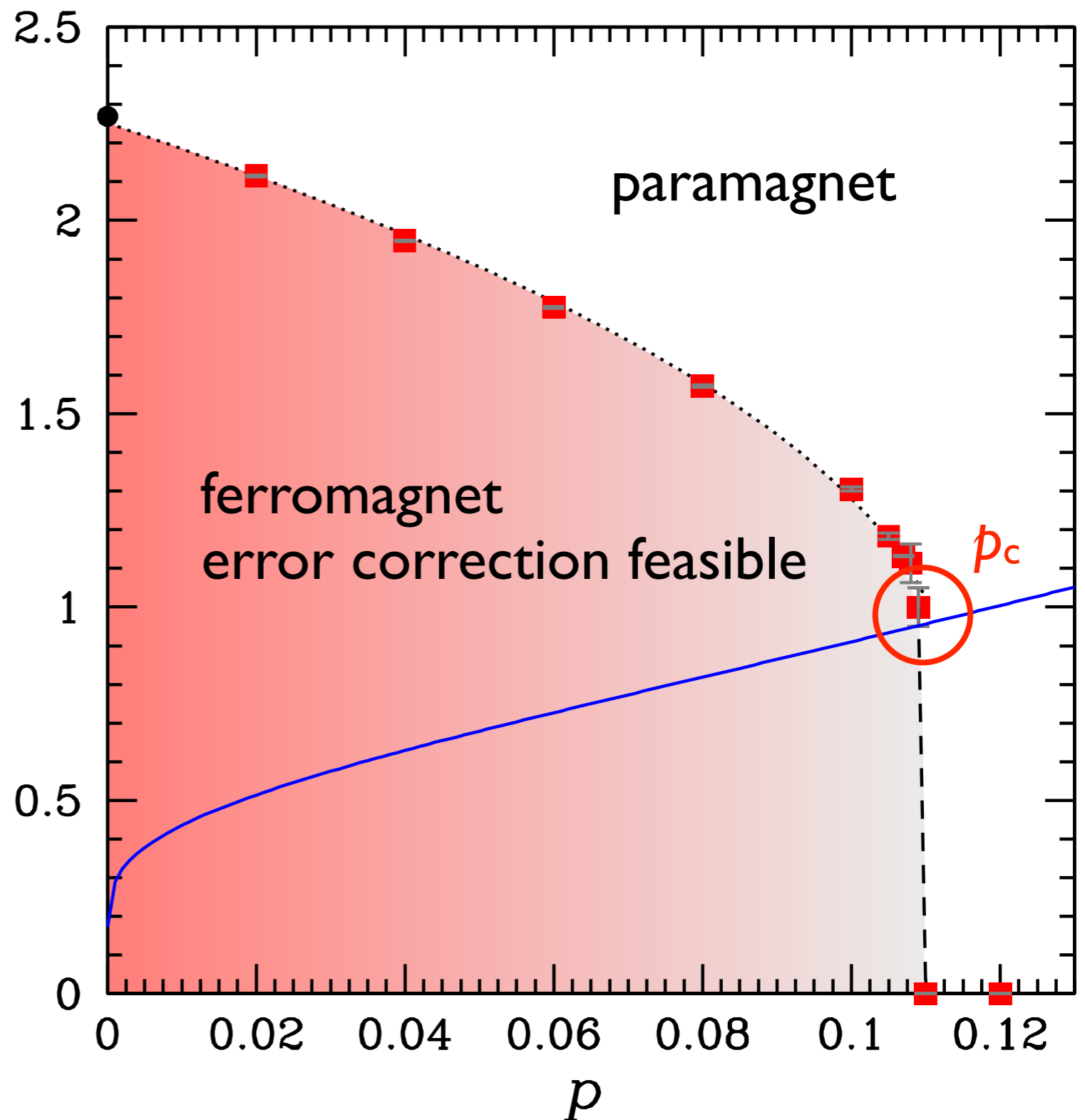
- 54 CPU years later...
- Error threshold:
 $p_c = 0.109(2)$
- Note: p_c does not violate the Gilbert-Varshamov bound $p \sim 0.110027$.
- Same as Kitaev model and TCC on triangular lattices.



Phys. Rev. A 81, 012319 (2010)
Phys. Rev. Lett. 103, 090501 (2009)

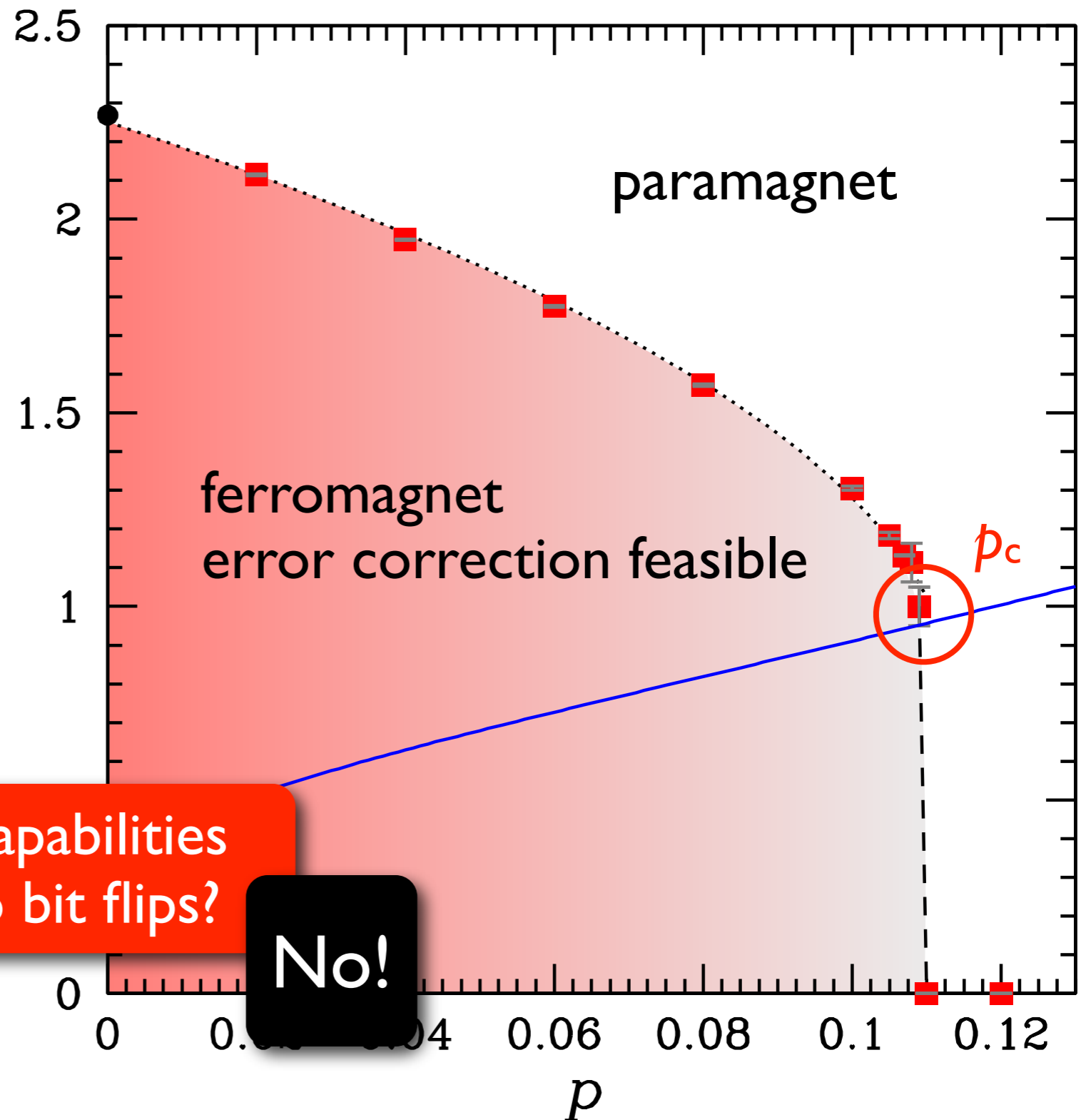
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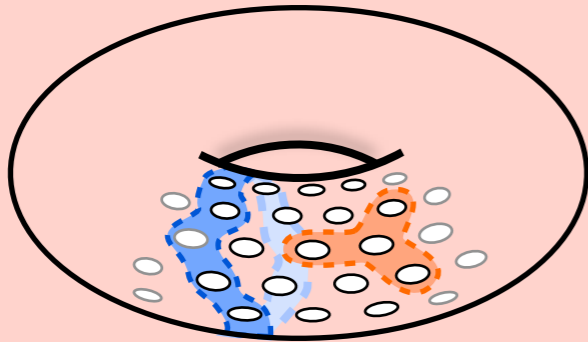
Do wider computational capabilities imply a lower resistance to bit flips?

No!

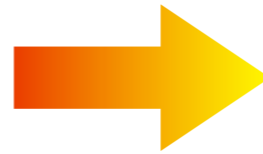
Measurement errors

Add measurement errors...

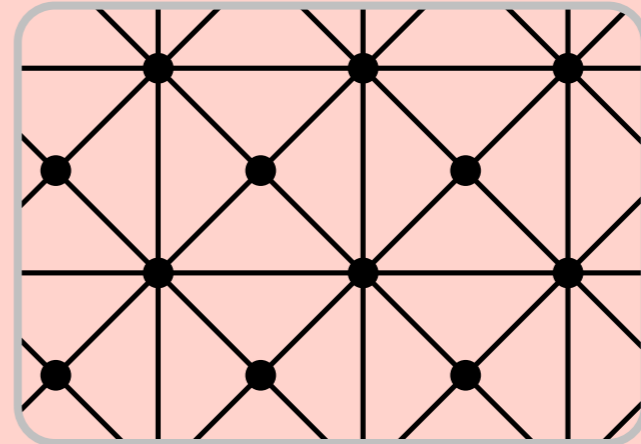
bit-flip errors



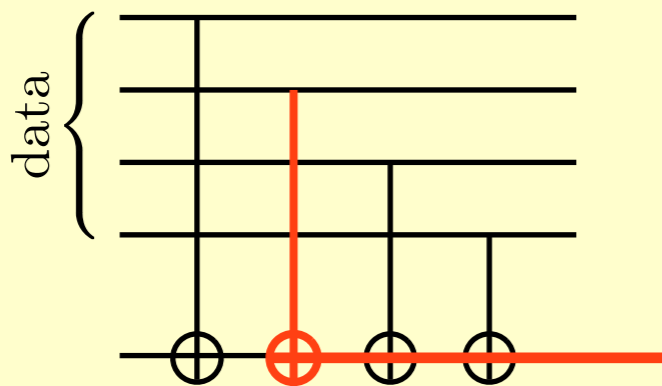
error rate p



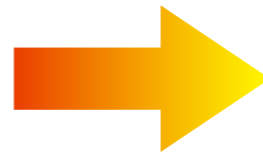
2D random model



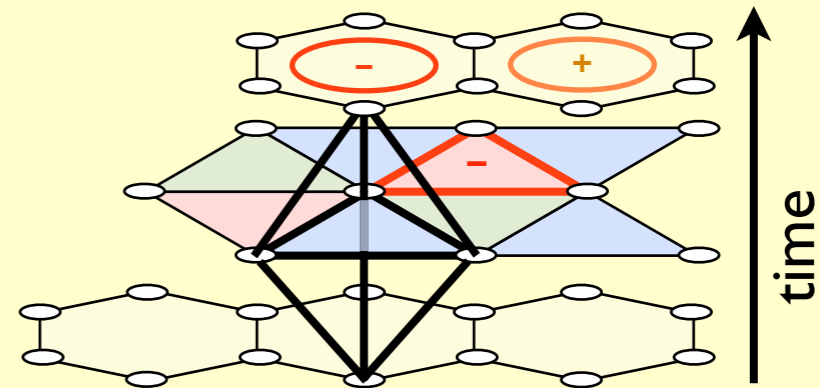
measurement errors



error rate q

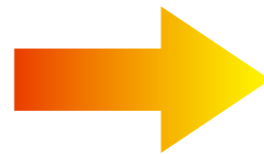
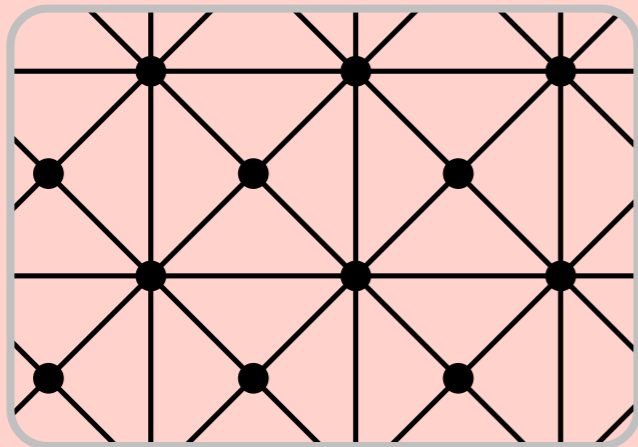


3D lattice gauge theory



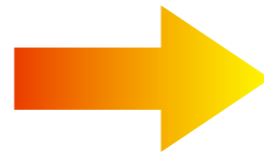
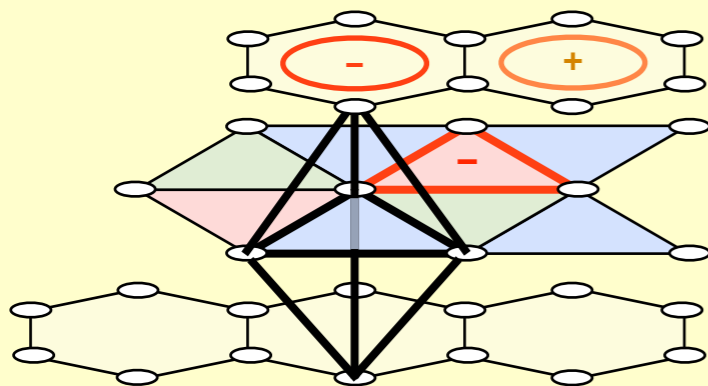
3D disordered lattice gauge theory

2D random model



$$\mathcal{H} = J \sum_{\langle ijk \rangle} \tau_{ijk} S^i S^j S^k$$

3D lattice gauge theory

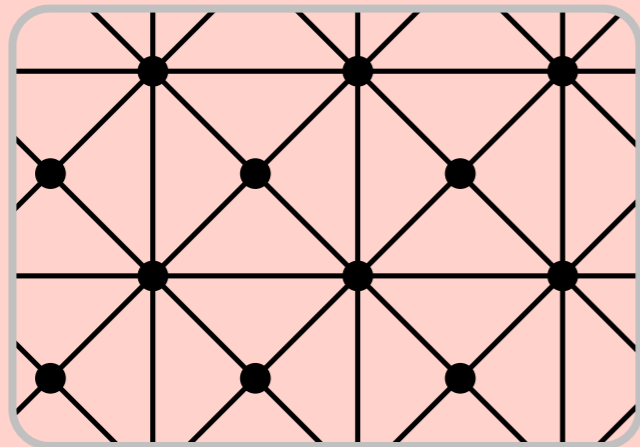


$$\mathcal{H} = - \sum_{\text{diamond}} J_j [S^j]_5 - \sum_{\text{hexagon}} K_k [S^k]_6$$

$$J_j, K_k = \begin{cases} -1 & \text{probability } p, q \\ +1 & (1-p), (1-q) \end{cases}$$

3D disordered lattice gauge theory

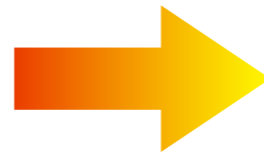
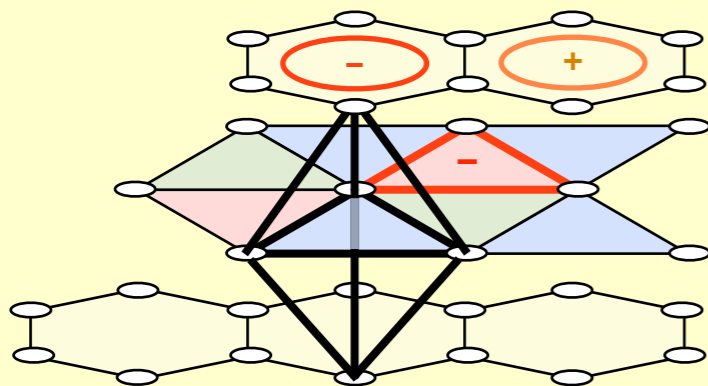
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for simplicity $p = q \dots$

3D lattice gauge theory

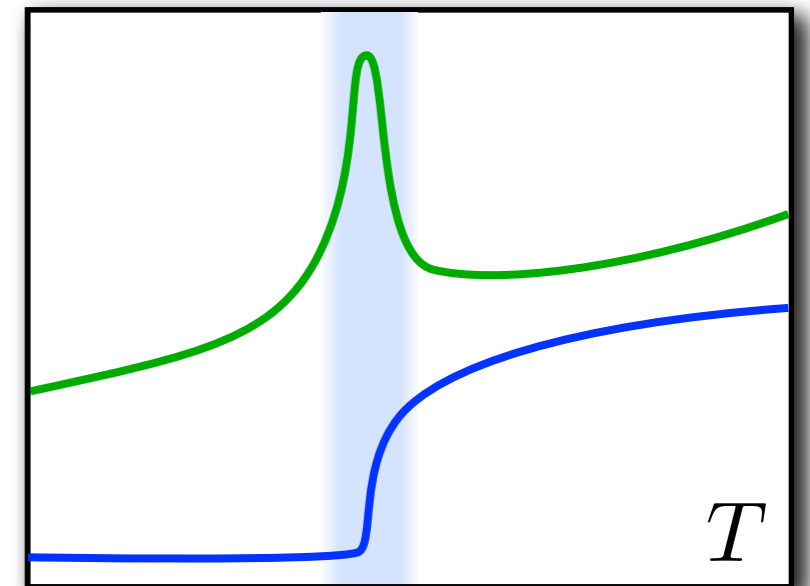


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Order parameter

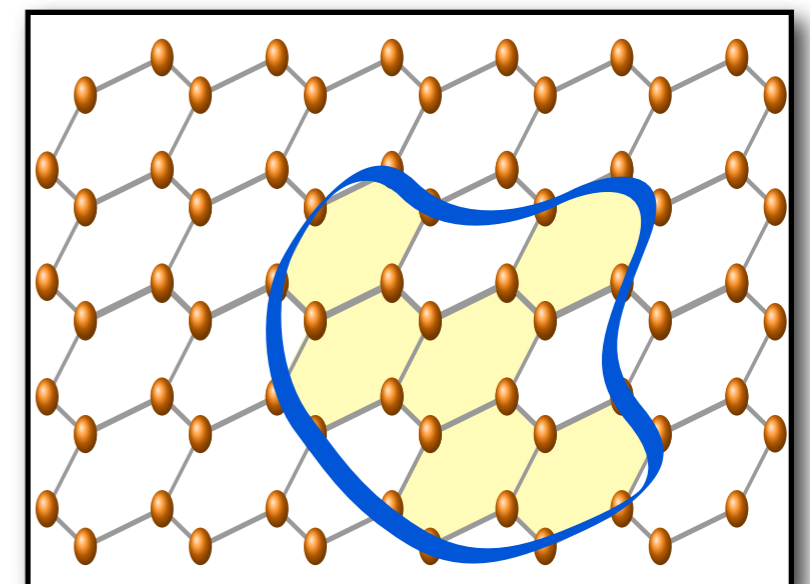
- **Problems:**
 - Local order parameters (magnetization) do not work for LGTs.
 - The transition is *first order*.
 - Both **specific heat** and **energy** imprecise.



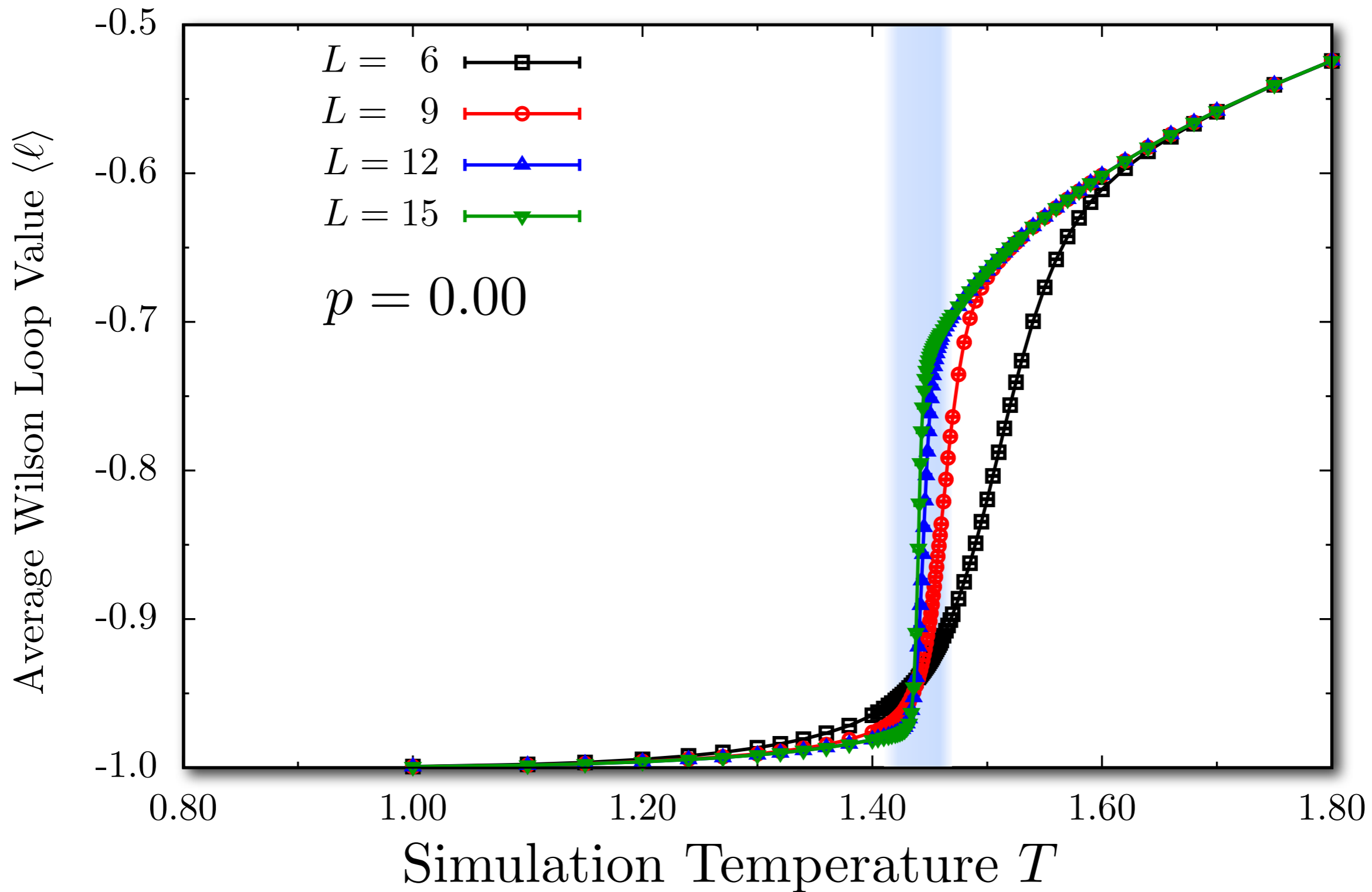
- **Solution:**
 - Wilson loops in the hexagon plane

$$\ell = \frac{1}{N_{\text{loops}}} \sum_{\text{loops}} \prod_{j \in \text{loop}} S_j$$

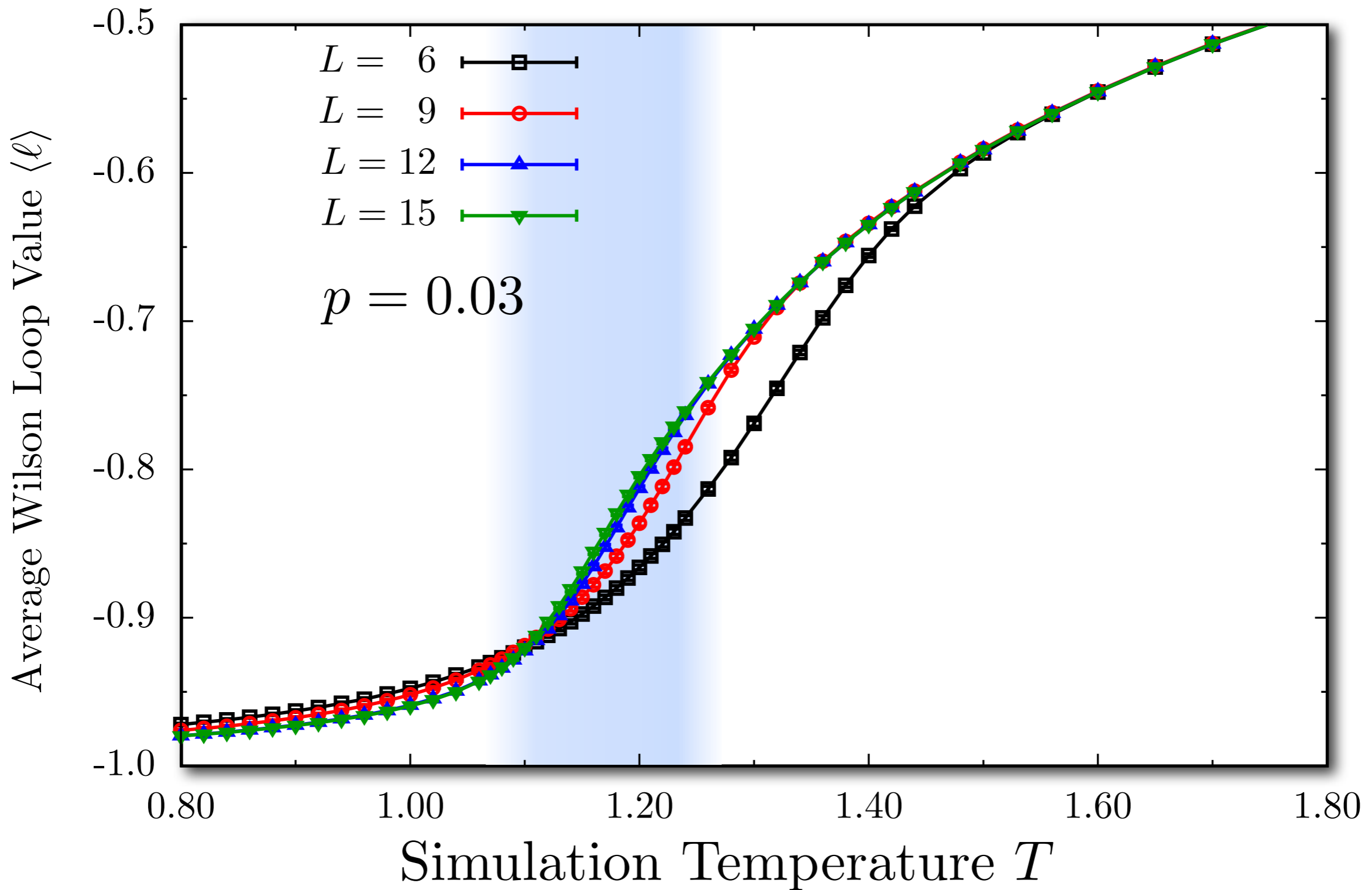
- Note: here we use minimal loops over one plaquette to reduce corrections.



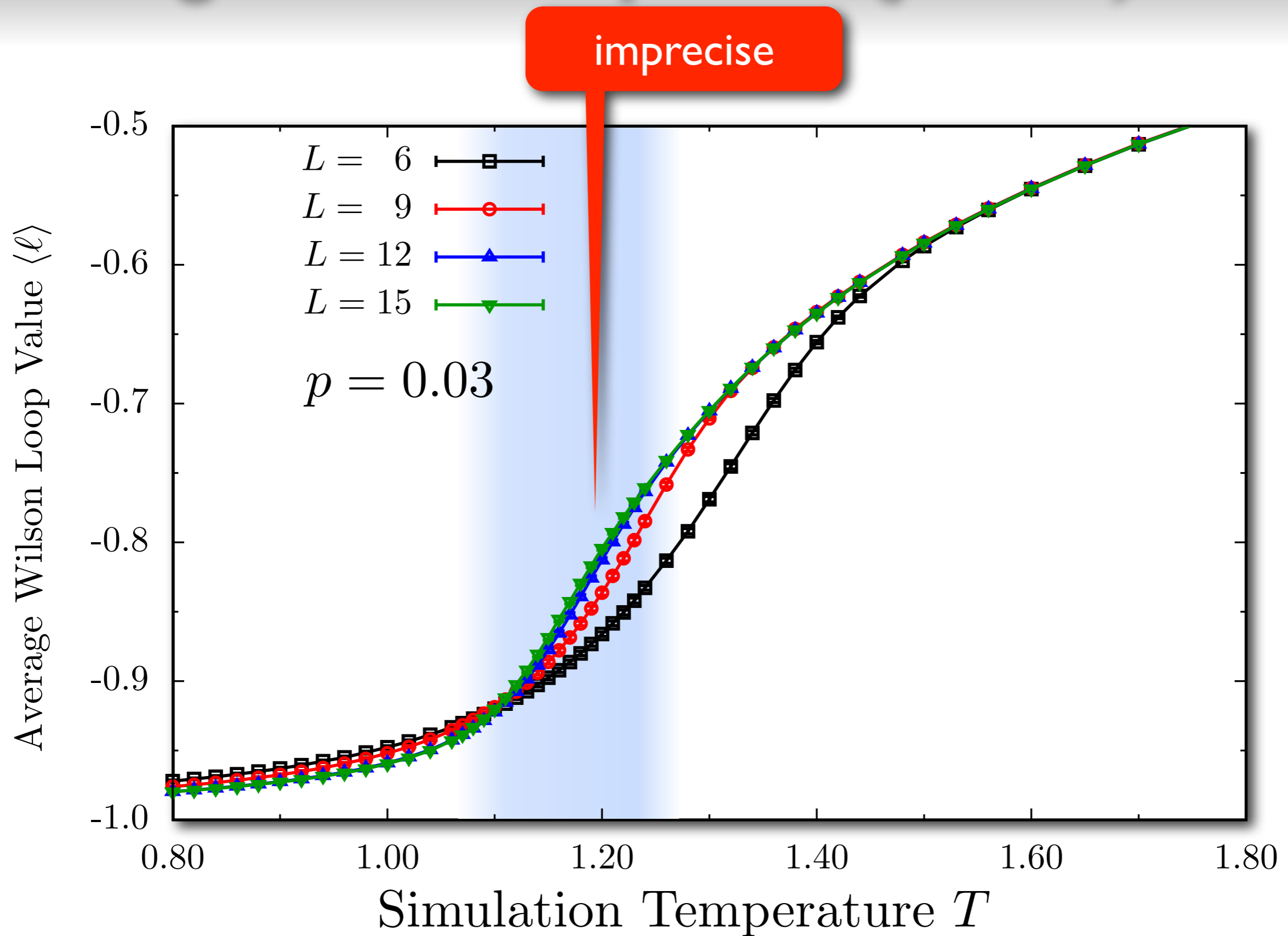
Average Wilson loop value (no errors)



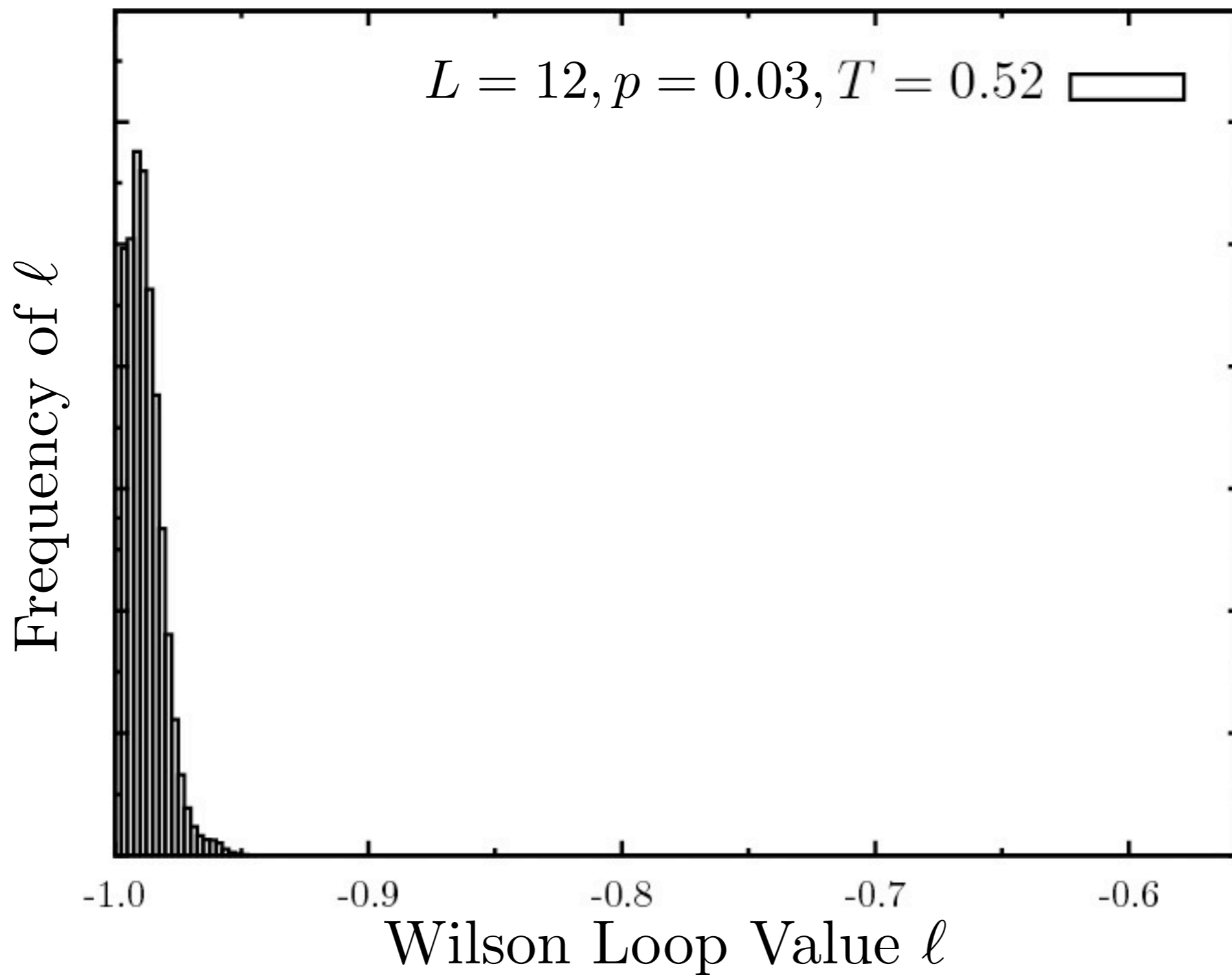
Average Wilson loop value ($p = 3\%$)



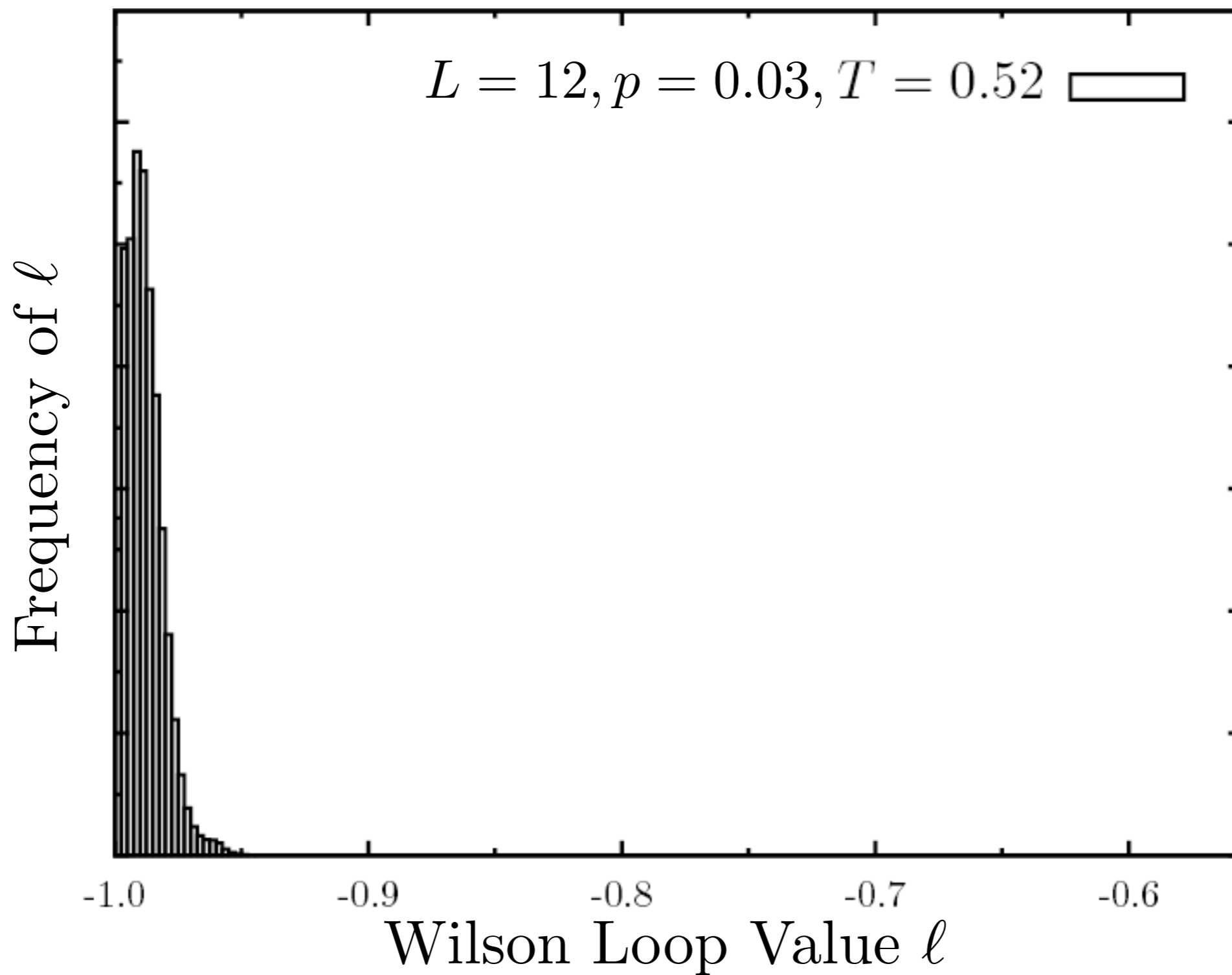
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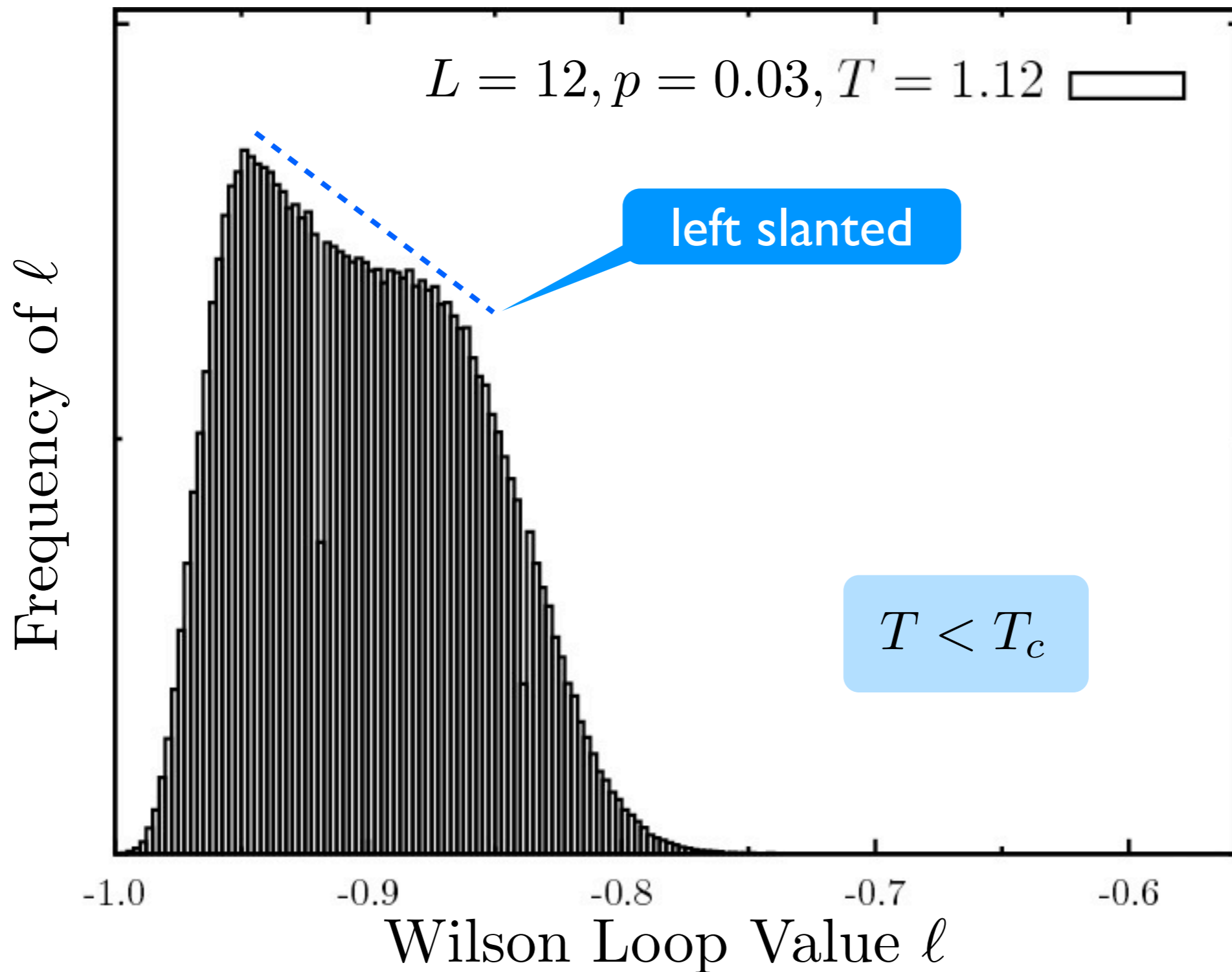
Wilson loop distribution ($p = 3\%$)



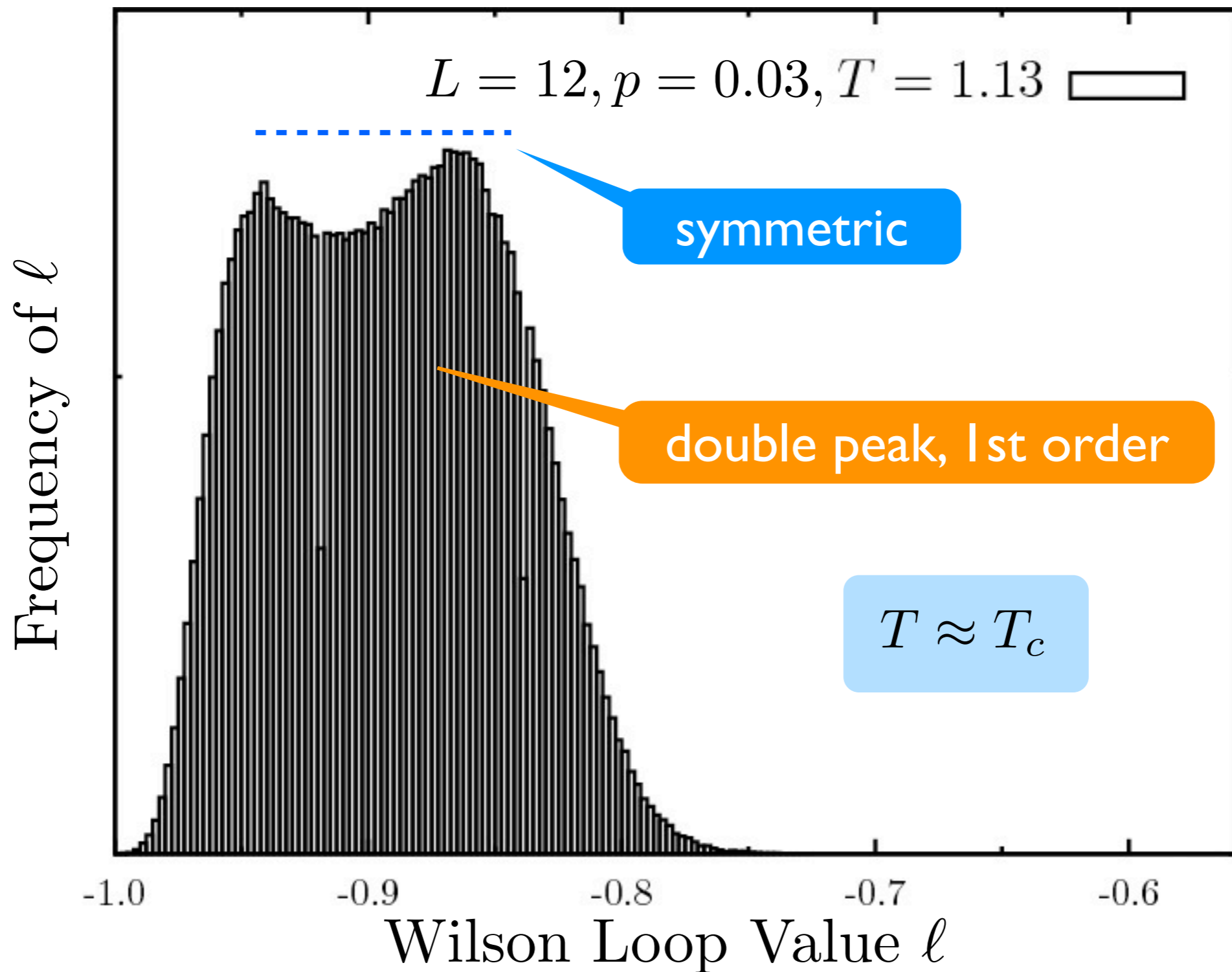
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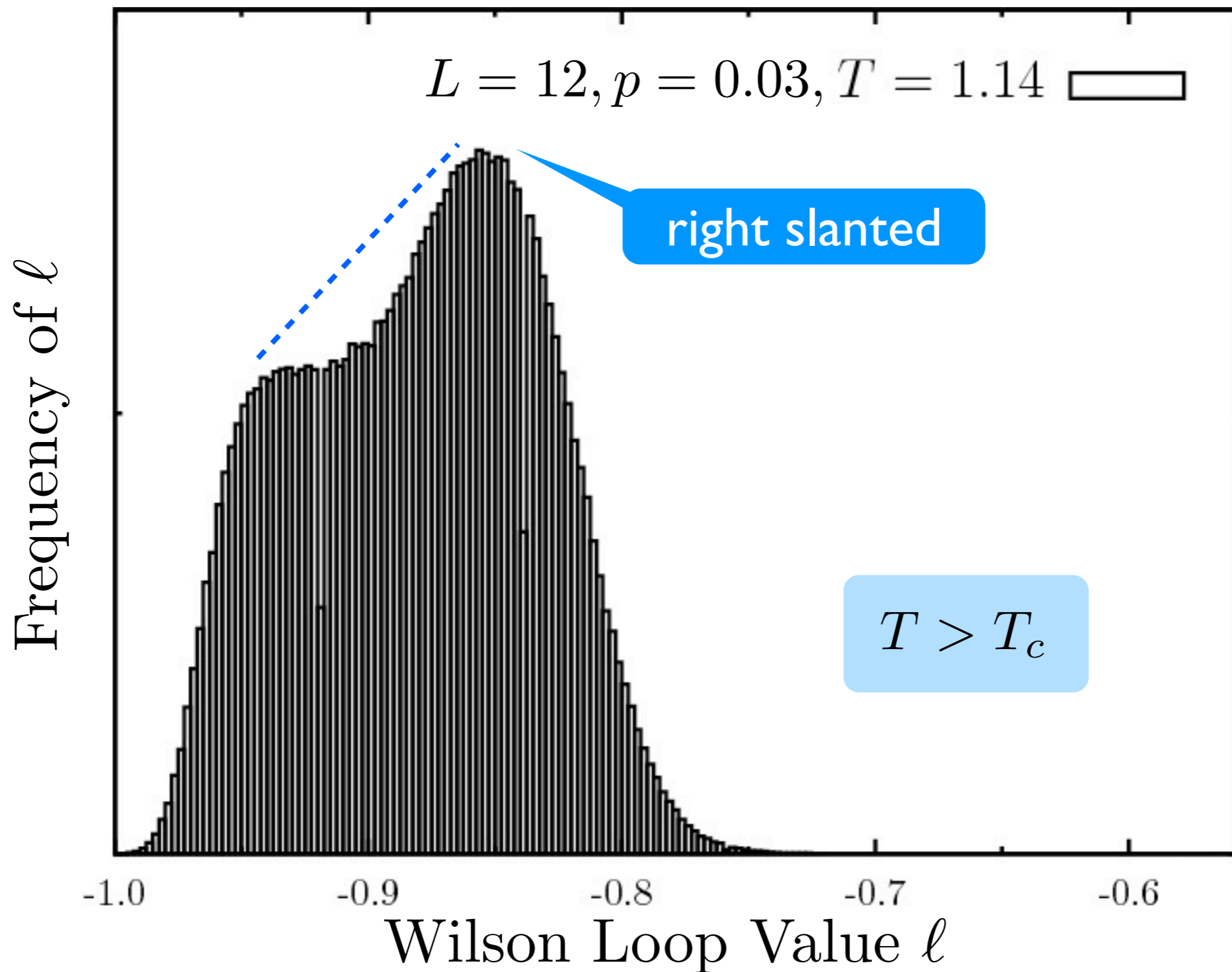
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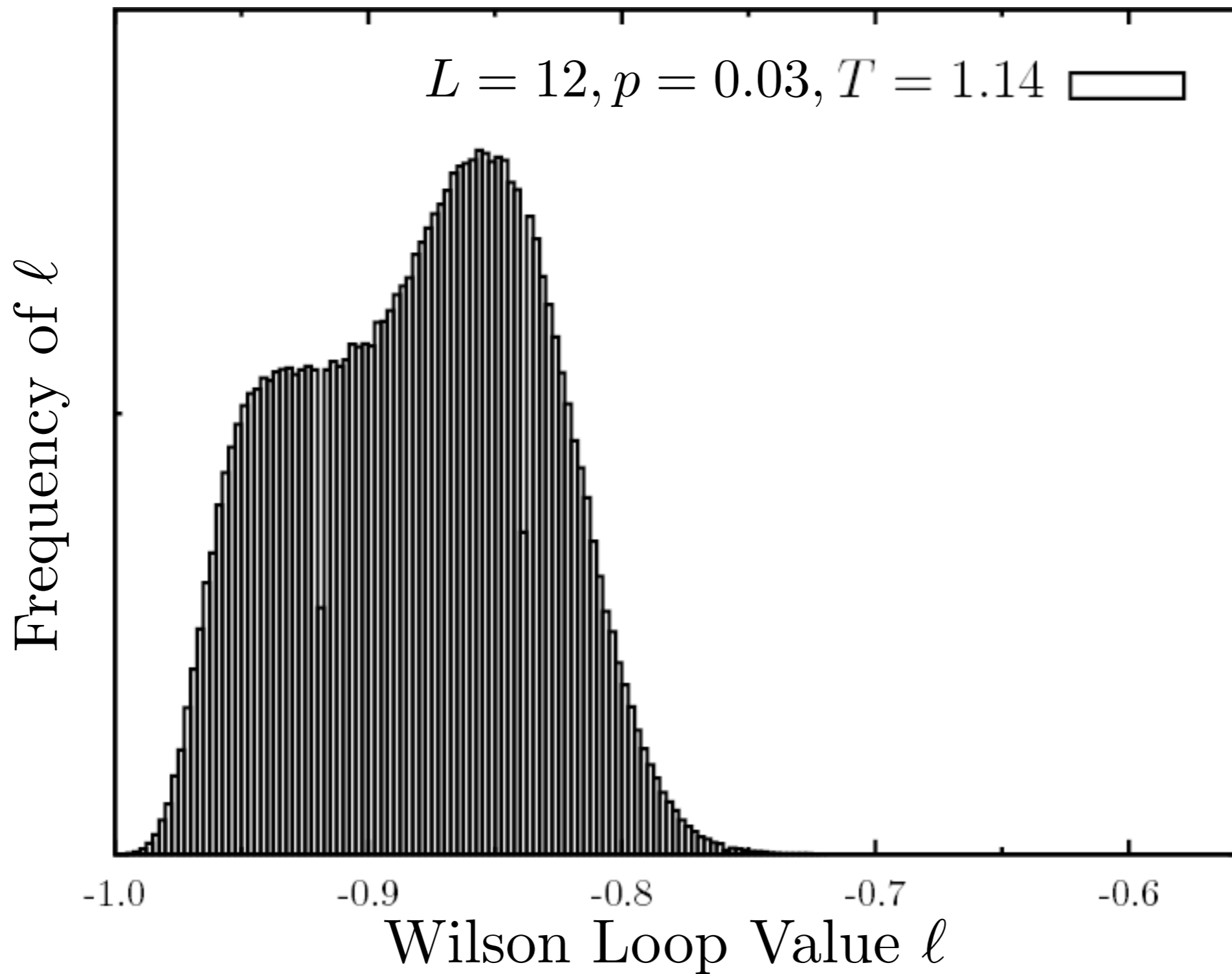
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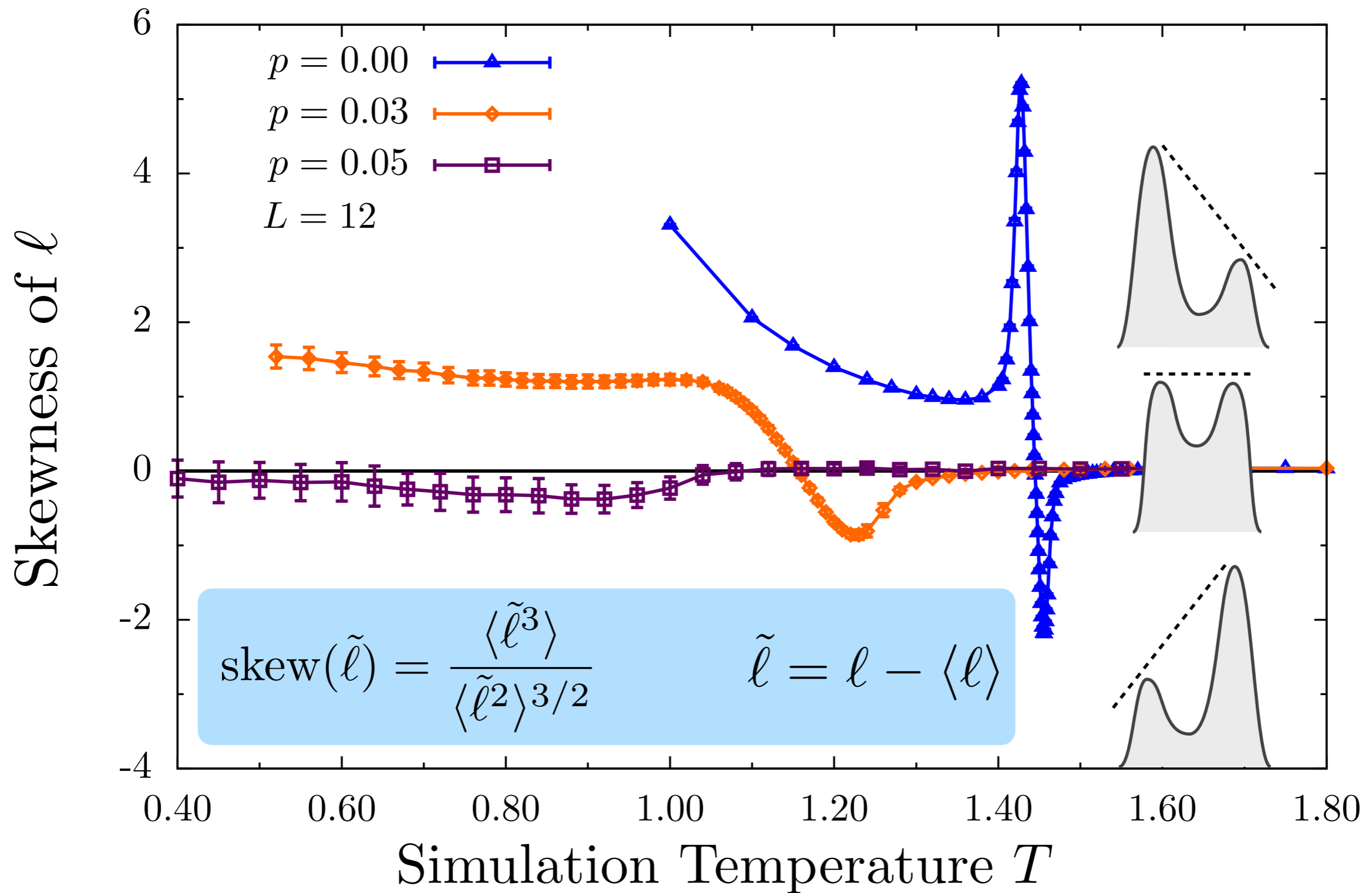
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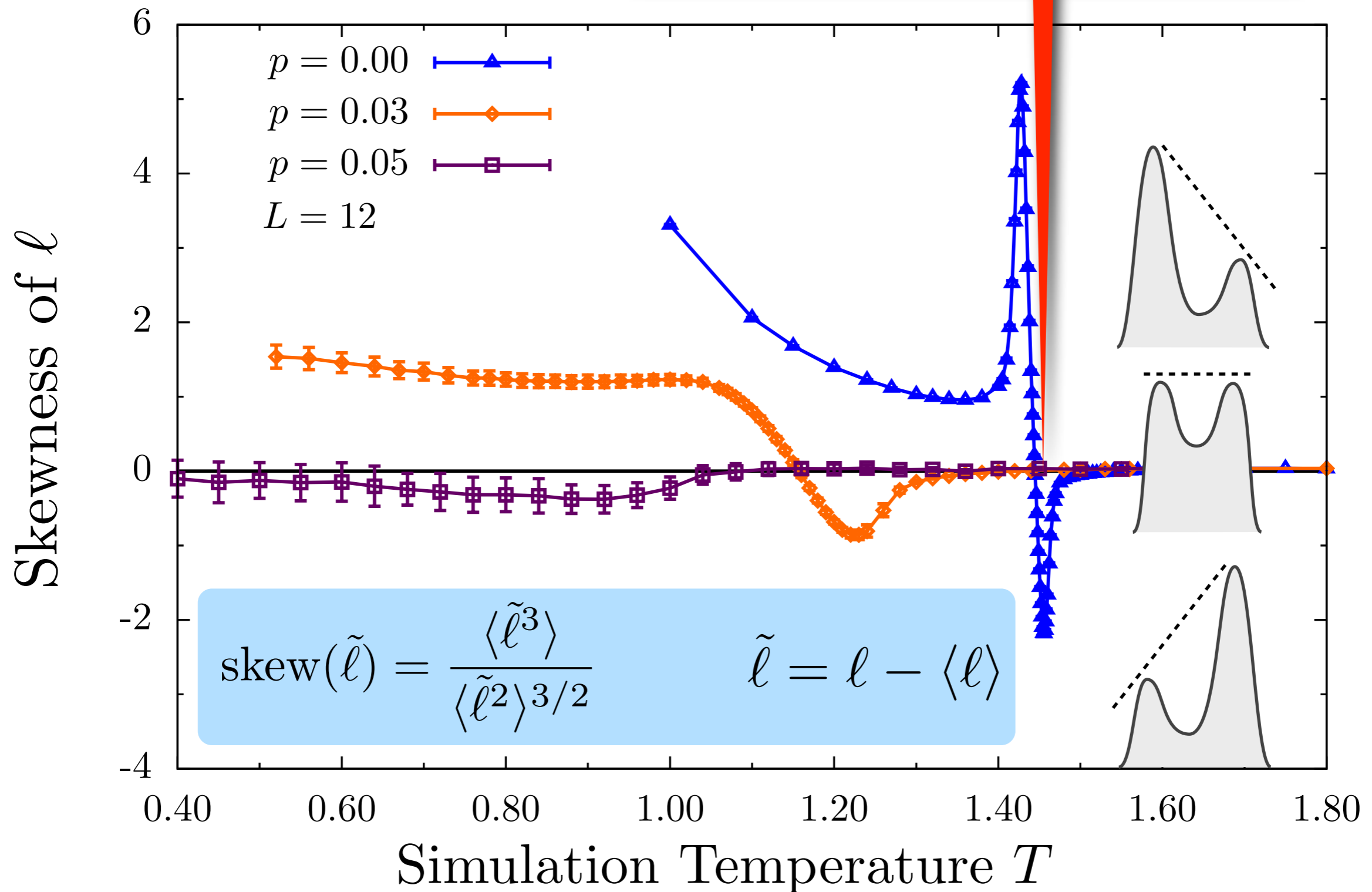


Skewness as a “Binder parameter”



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agrees with C_v and E , Maxwell



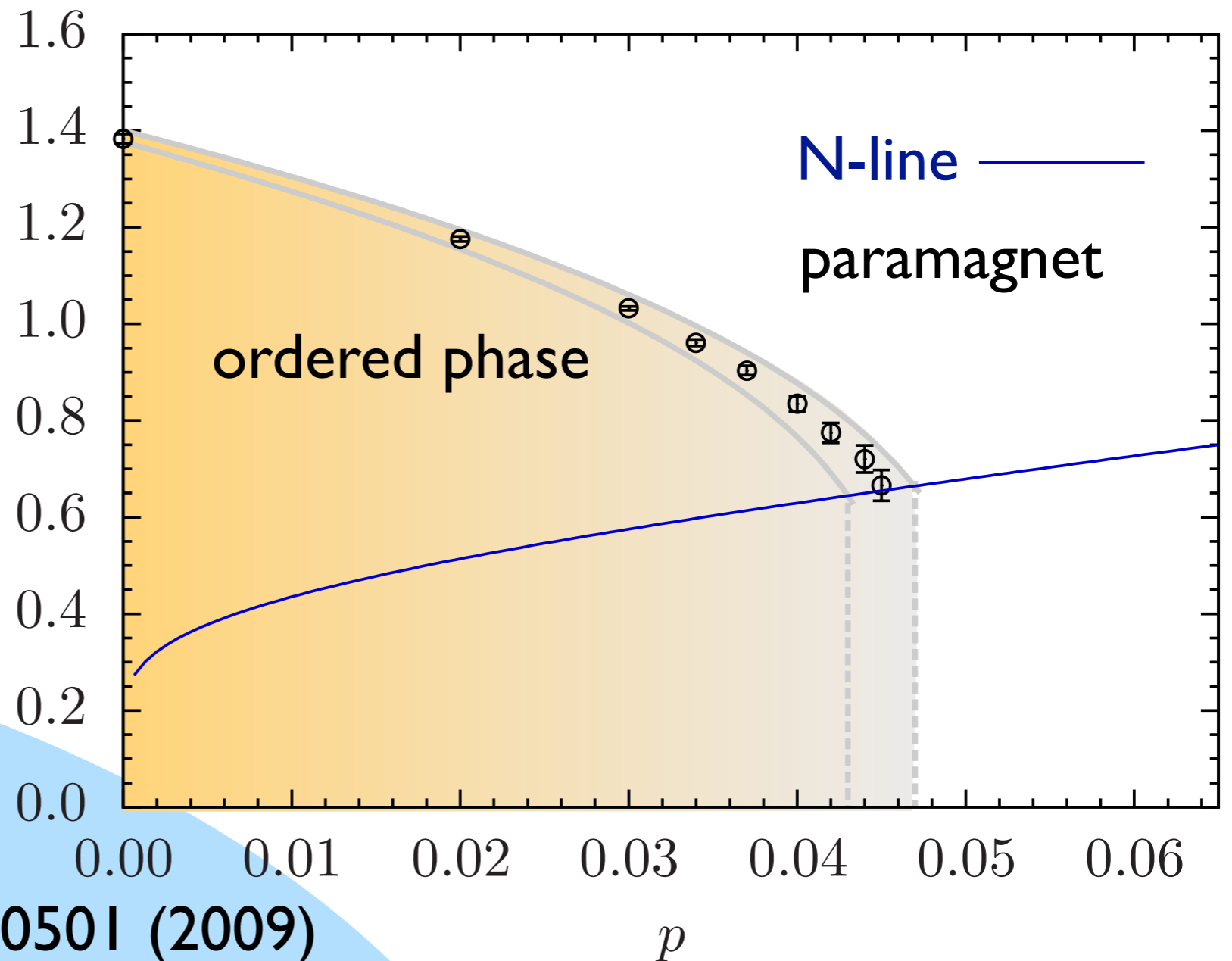
Error threshold with measurement errors

- 23 CPU years later...
- Extrapolate ($L \rightarrow \infty$)...
- Threshold:

$$p_c = 0.045(2)$$

- Revisit TC ($p_c = 3\%$)
Ohno et al., Nuc Phys B (04)

- See also:
 - Phys. Rev. Lett. 103, 090501 (2009)
 - Phys. Rev. A 81, 012319 (2010)
 - arXiv:quant-physics/1005.0777, PRL subm.



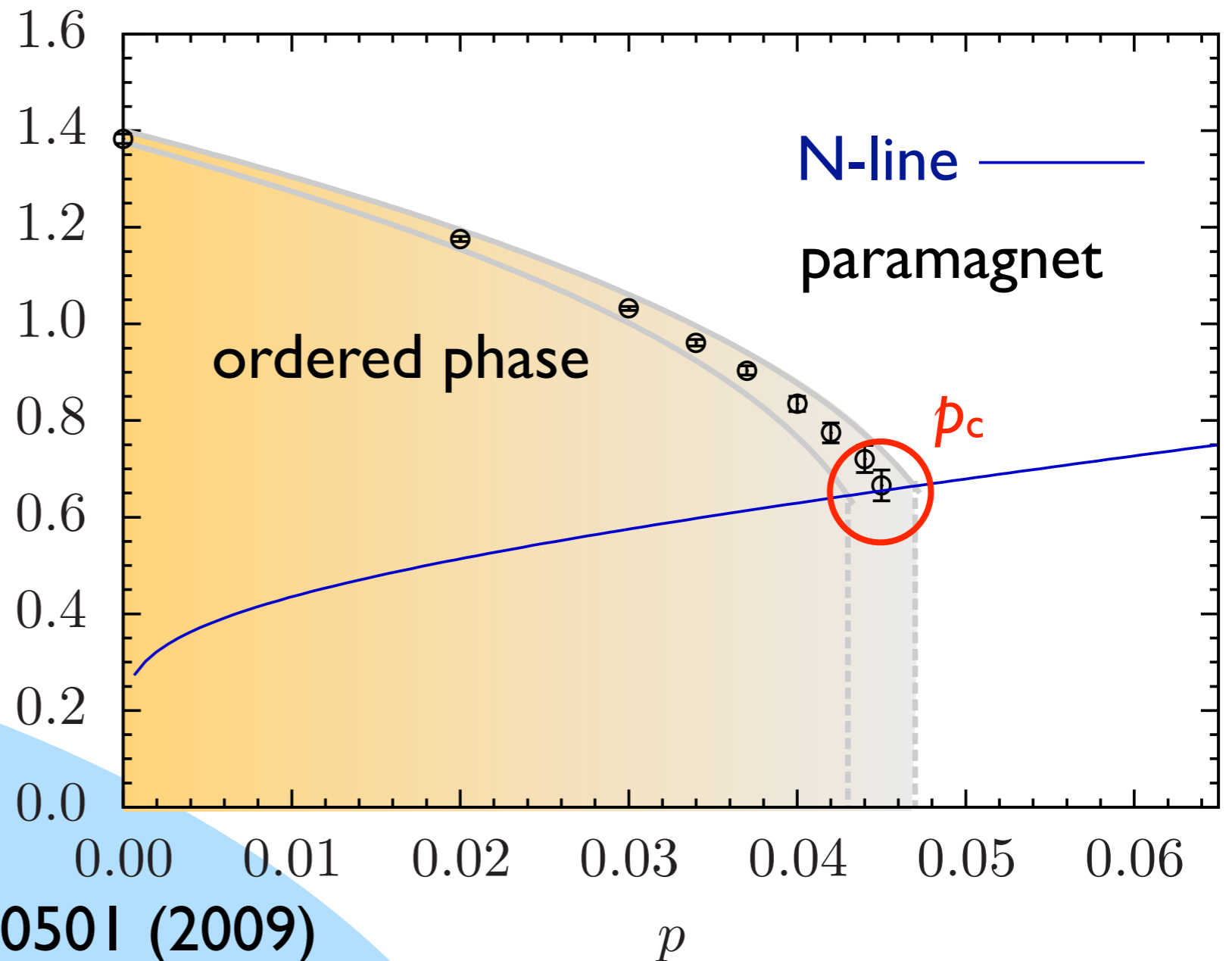
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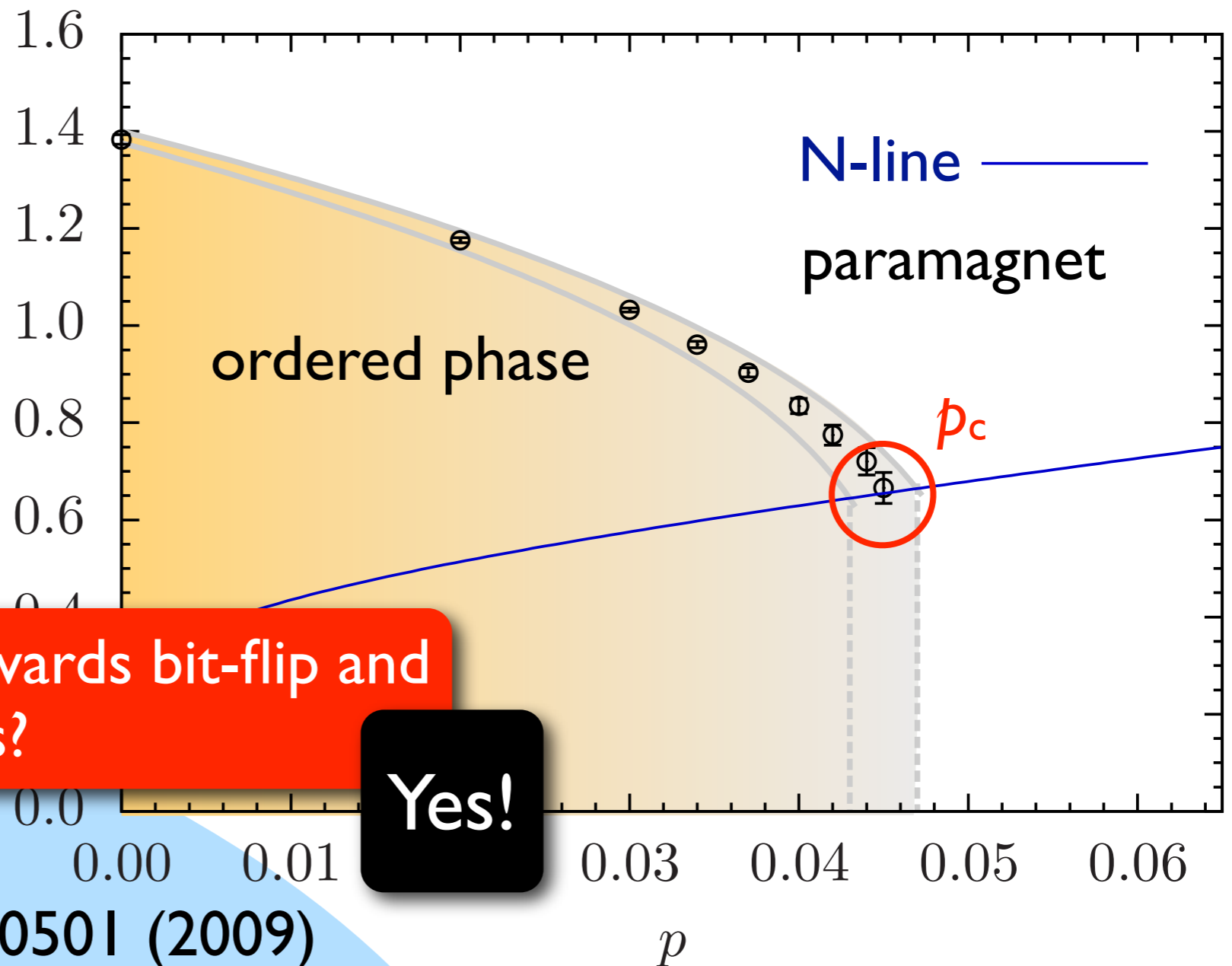


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Are TCCs stable towards bit-flip and measurement errors?

Yes!

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