

Spring 2022 - PHYCS426

# INVESTIGATING MAGNETISM WITH THE ISING MODEL

## Instructor

Dr. Jawad Mohammed Taher Alsaie

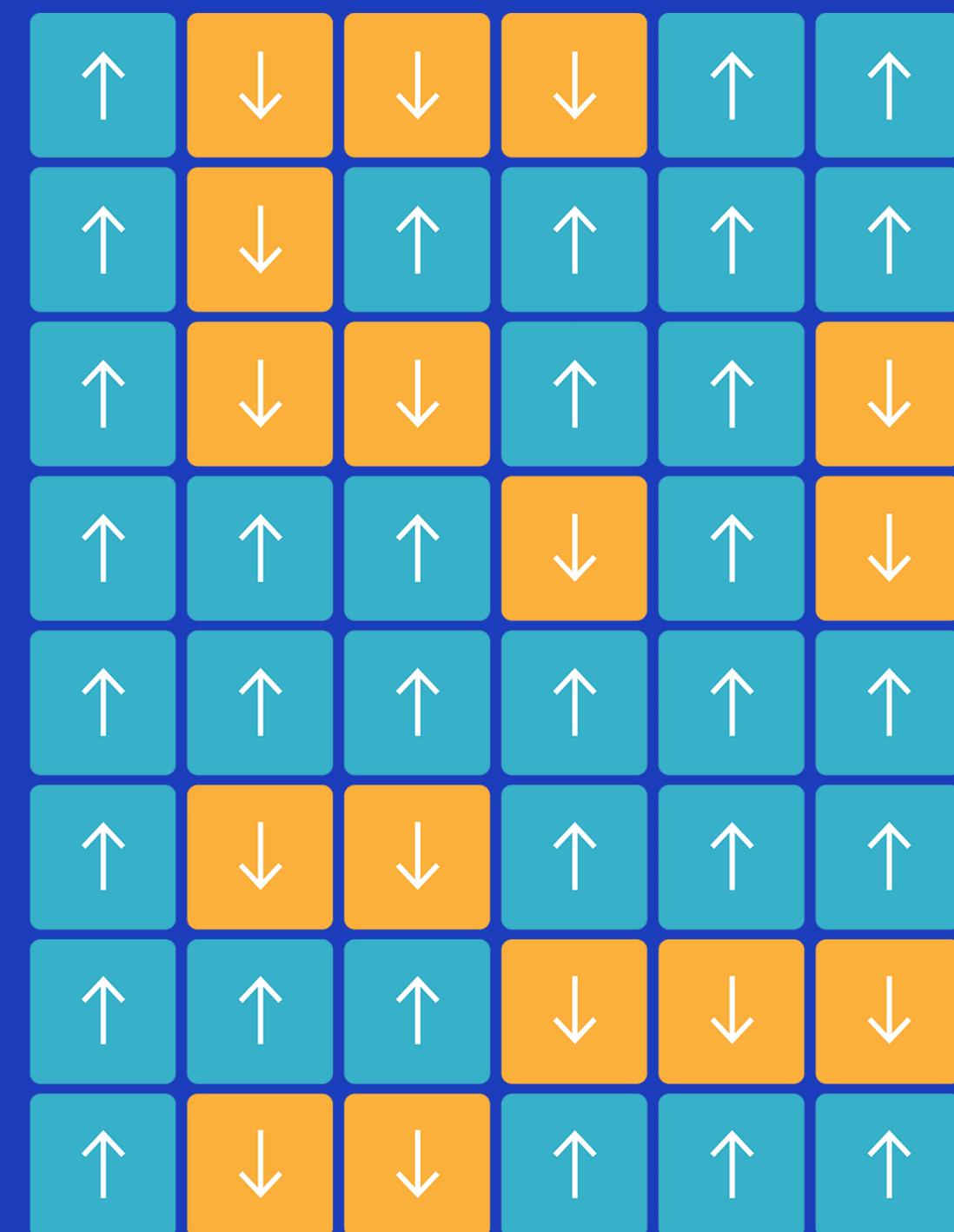
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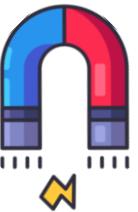
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# INTRODUCTION

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- The Enduring Mystery of Magnets
- Types of Magnetisms
- The Ising Model
- Monte Carlo Metropolis Method



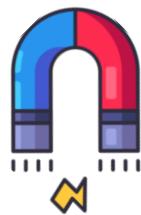
# ● The Enduring Mystery of Magnets

How do **magnets** work?

It turns out we need **quantum mechanics** to fully explain it.

Ancient **Greeks** found that certain stones **attracted** pieces of **iron**.

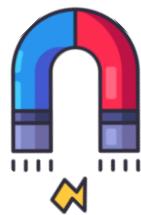
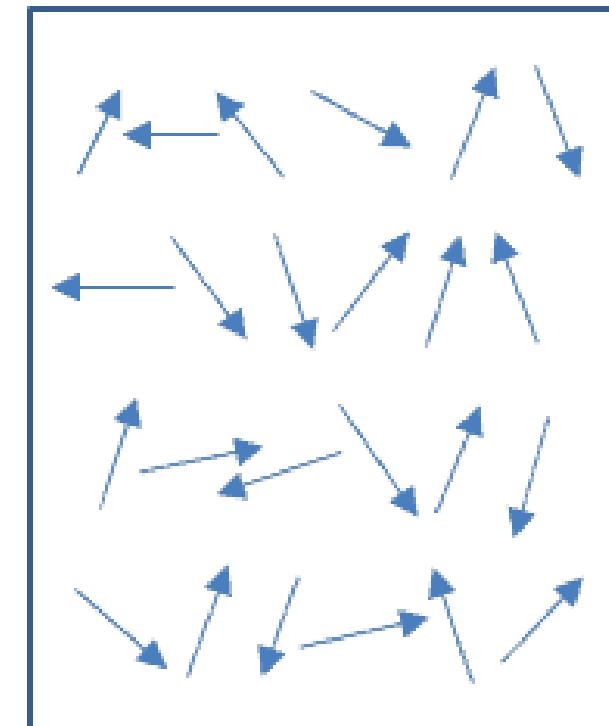
In fact, the word “**magnet**” comes from the Greek region of **Magnesia**, where these stones were observed.



# ● Types of Magnetisms

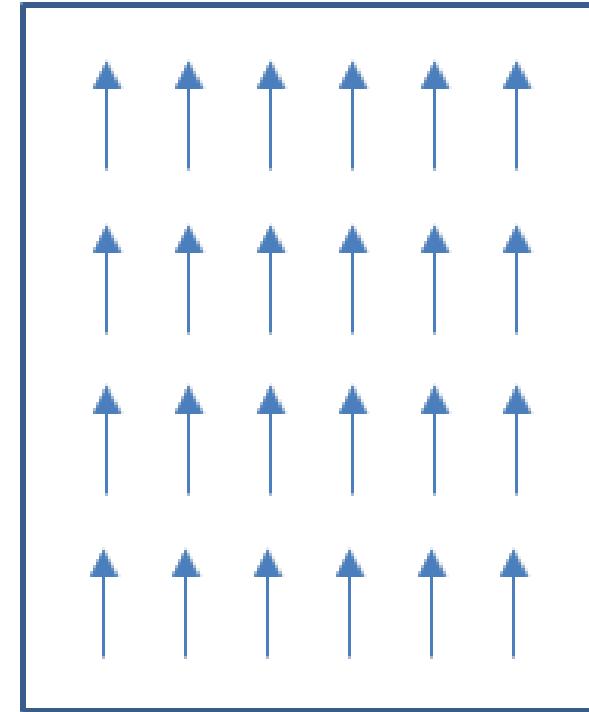
## Paramagnetic Materials:

- Composed of atoms/ions that have a **permanent atomic dipole**.
- Aligns in the direction of **external magnetic field**. No **permanent magnetization** without external field.
- Susceptibility  $\chi$  is **small** and **greater than 0**.



## Ferromagnetic Materials:

- Possess a permanent magnetization (via domains), even in the absence of external field.
- Strongly aligns with external magnetic field.
- Possess very large positive susceptibility.
- Characterized by a critical Temperature called Curie Temperature above which they exhibit paramagnetism.

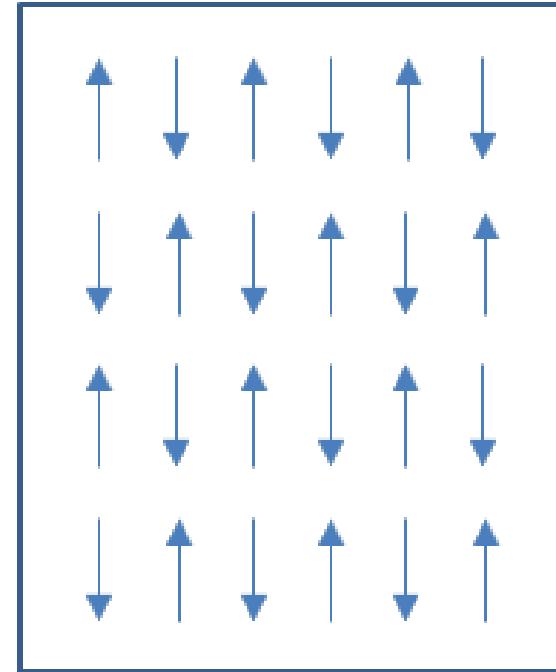


Ferromagnetic ordering



## Anti-ferromagnetic Materials:

- Unlike ferromagnets, the **intrinsic magnetic moments** tend to **cancel** each other out. (Due to neighboring unpaired electrons having opposite spins)
- Characterized by the **Néel temperature**, above which the material exhibits **paramagnetic** behavior.
- Usually **not attracted** by external field, with **small susceptibility**.

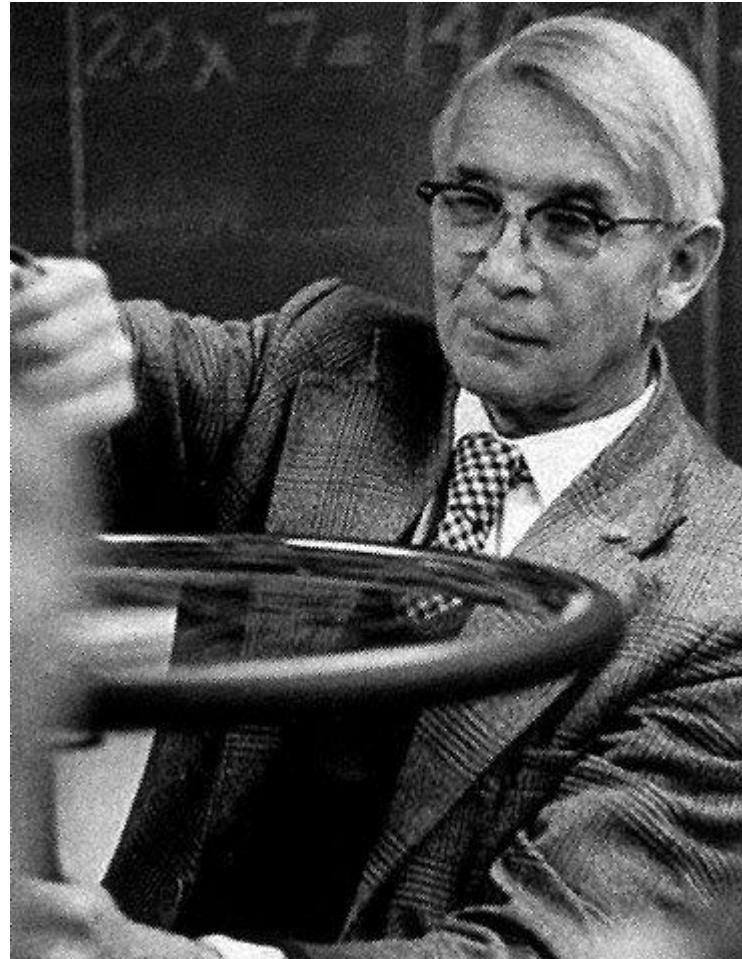


Antiferromagnetic ordering

# ● The Ising Model

The Ising model is a **toy model** of **magnetism** that simplifies the picture of magnetism at the atomic level.

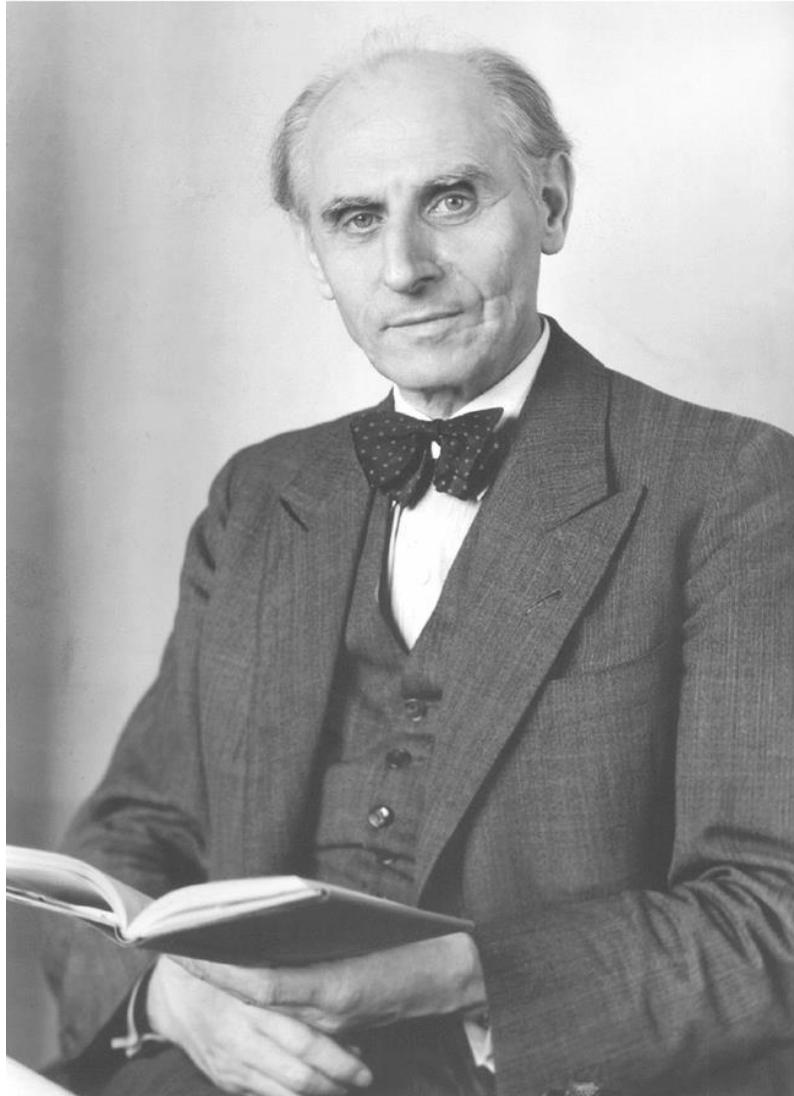
It models the **interaction** of **atoms** by treating them as **small magnets** ("Spins") that point either **up/down**.



There are 2 competing "forces" at play:

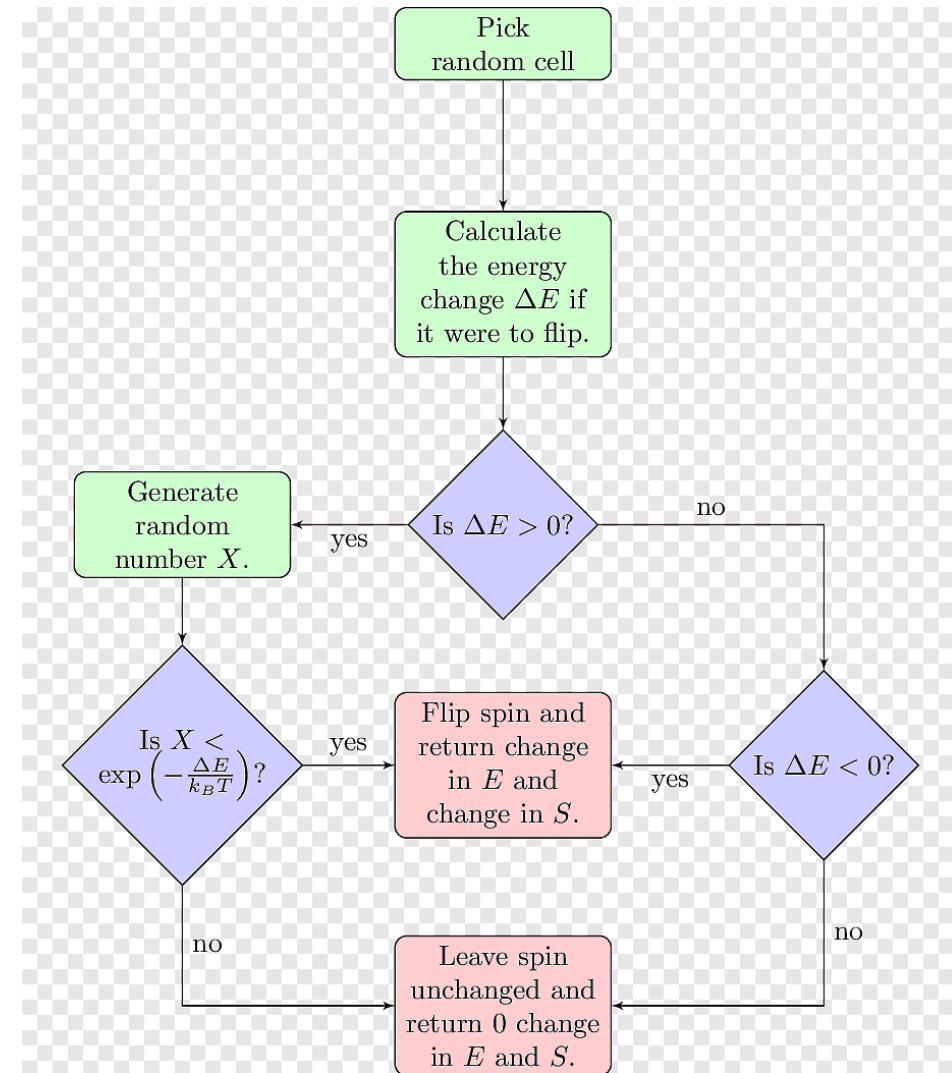
- 1) The **interaction** of magnetic moments/"**spins**" of the atoms with each other and external **magnetic** field. (This tends to align them).
- 2) The **tendency** of external **temperature** to induce random **fluctuations** in the system.

$$H = - \sum_{i,j} J_{ij} \sigma_i \sigma_j + h \sum_i \sigma_i$$



# ● Monte Carlo Metropolis Method

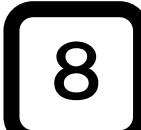
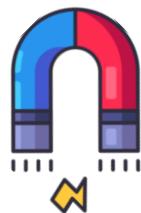
- Take a grid of spins and assign them an initial spin. Use periodic boundaries
- Go over the grid, and decide to flip/leave the spin unchanged based on "Metropolis-Hastings" Algorithm (Figure on right)
- Do the same for all spins in the grid
- Repeat this for specified "Monte Carlo Steps"



# MAGNETIC PROPERTIES

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- Magnetic Moment and Magnetization
- Magnetic Susceptibility
- Curie and Néel Temperature
- Coercive Field



# ● Magnetic Moment and Magnetization

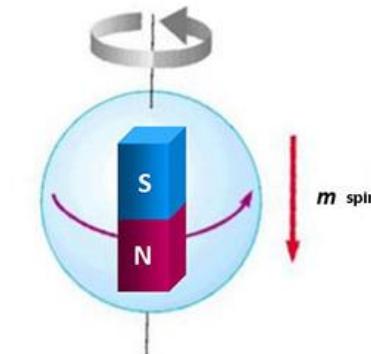
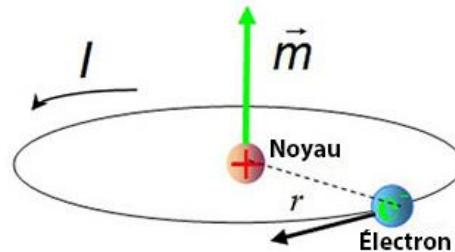
Magnetic moment is a measurement of magnetic dipole strength.

Magnetization is the density of magnetic dipoles, which are induced in a magnetic material by an external magnetic field.

Different materials react differently to external field, which allows us to classify them (ferro, para etc.).

$$\mu = IA \quad M = \frac{\mu}{V}$$

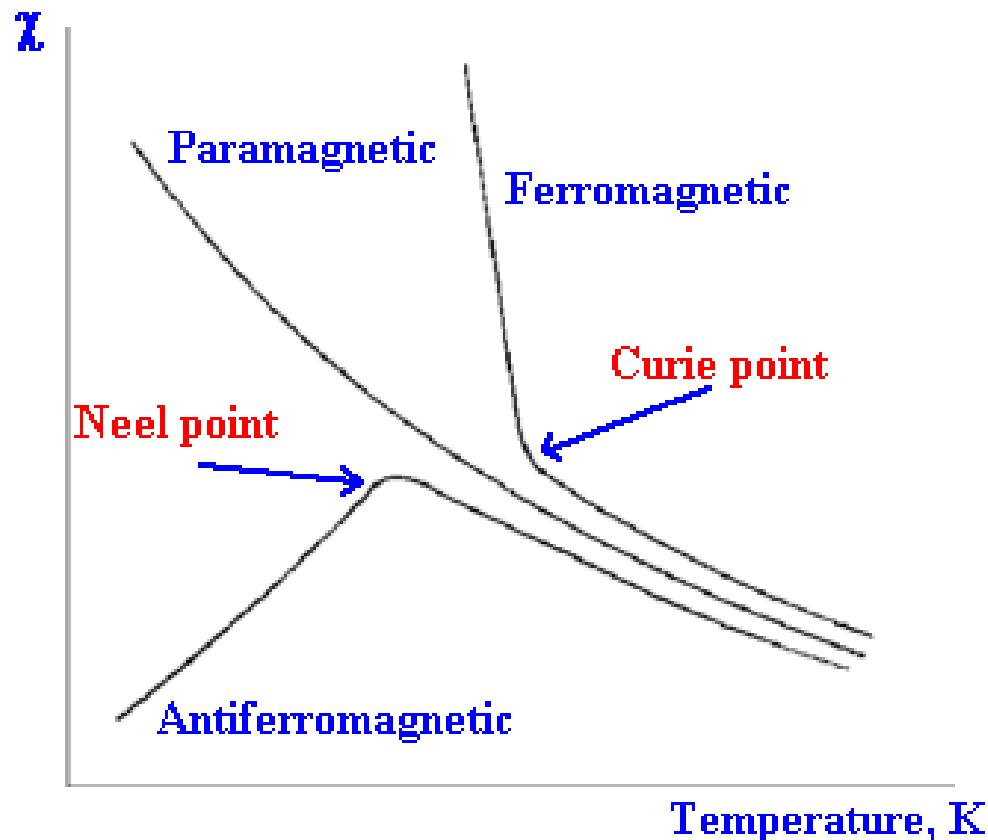
$$M = \sum S_{ij}$$



# ● Magnetic Susceptibility

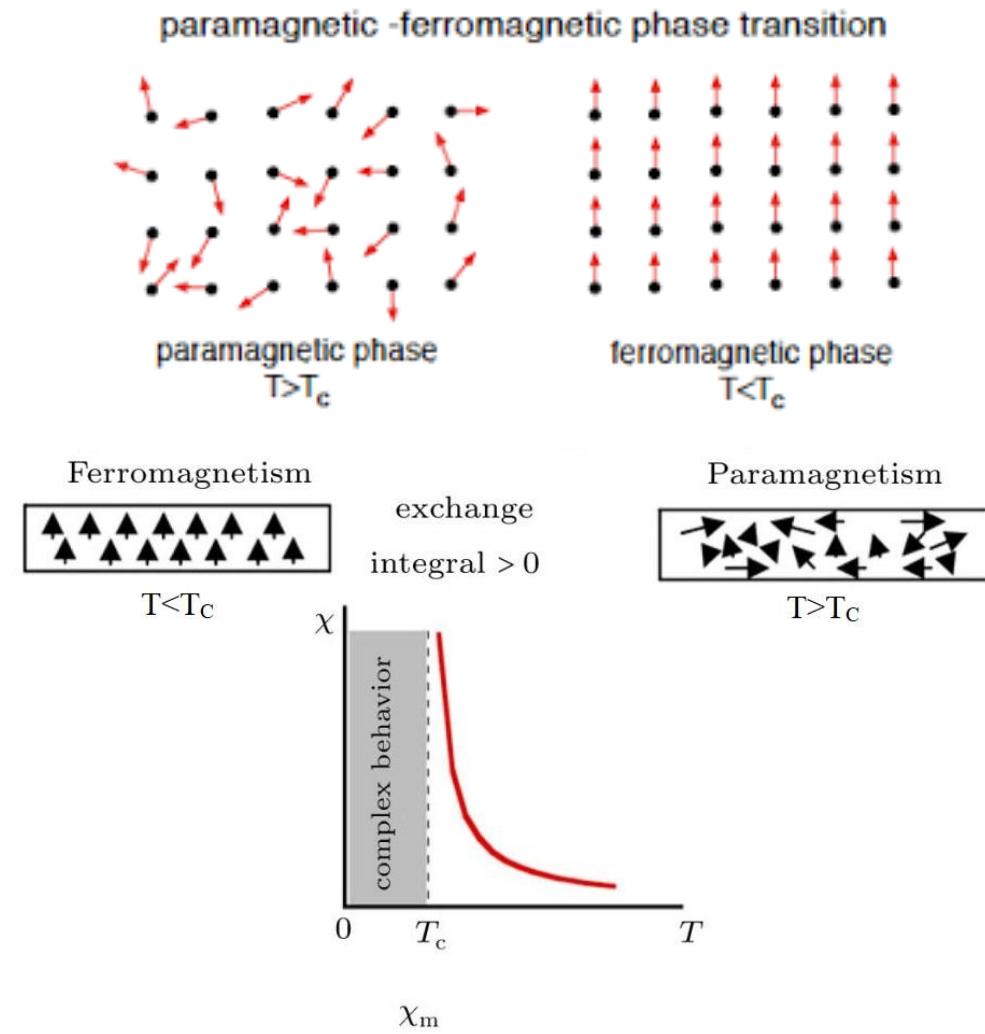
Magnetic susceptibility  $M=\chi H$

- Indicates the extent of magnetization in response to an external field  $H$ .
- Studying Susceptibility behavior allows us to classify magnetic materials.
- The sign indicates whether a substance is attracted/repelled.
- Susceptibility is usually a function of the temperature and indicates nature of magnetism.



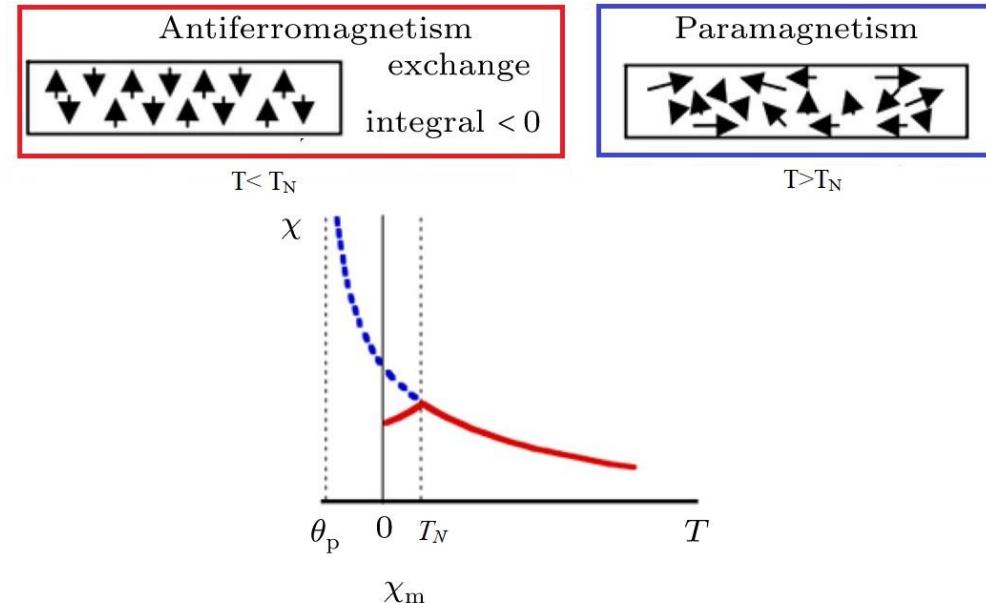
# ● Curie Temperature ( $T_c$ )

- It is the temperature at which a ferromagnetic material transitions into a Paramagnetic one.
- Below Curie temperature, the material is said to have "spontaneous magnetization"
- Curie Law is accompanied by first/second order phase transitions in several properties of the magnet:  $\langle M \rangle, X & C$



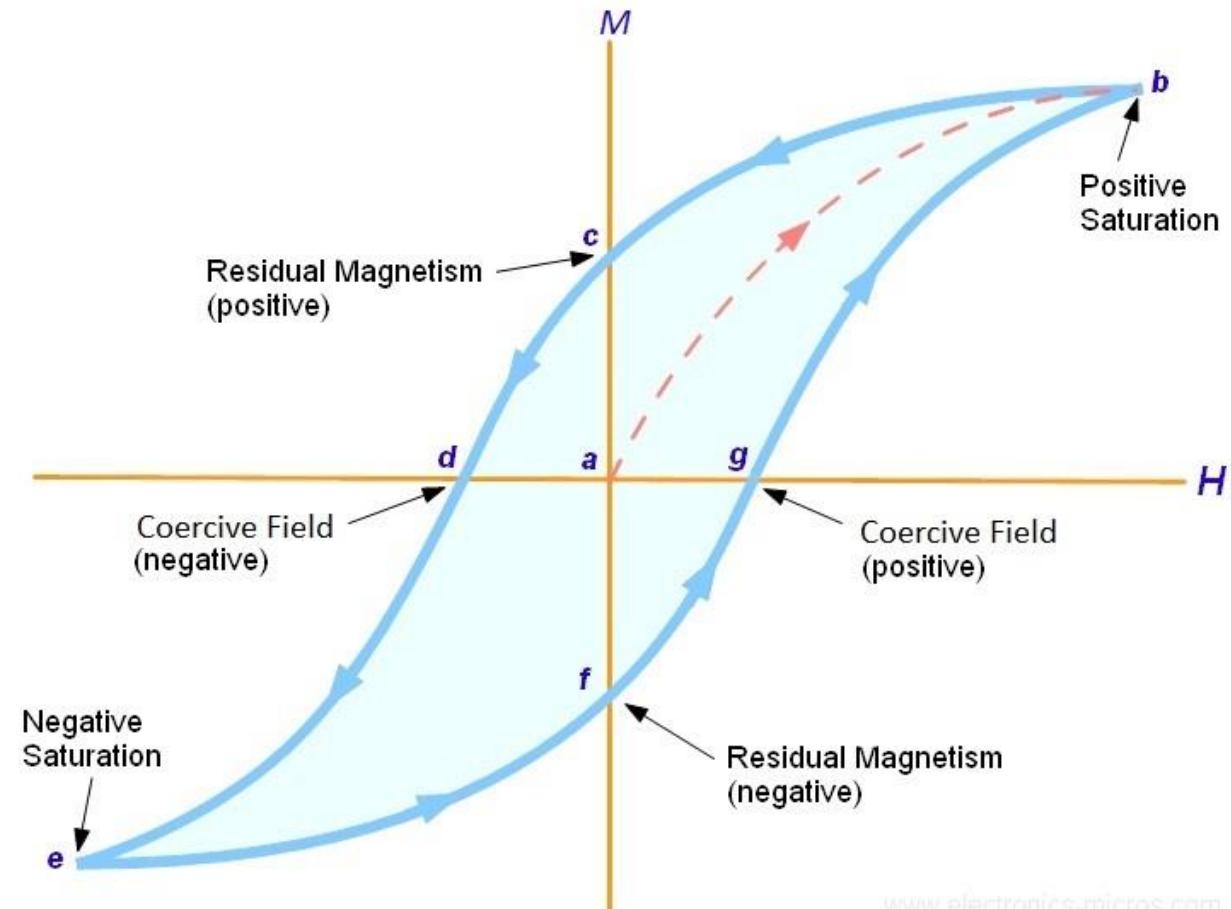
# ● Néel Temperature ( $T_N$ )

- It is the temperature at which an antiferromagnetic material transitions to paramagnetism.
- At Néel temperature, the anti-parallel alignment of the material is destroyed.
- Similar to Curie temperature, Néel temperature accompanies phase transitions in the magnetic properties of the substance.

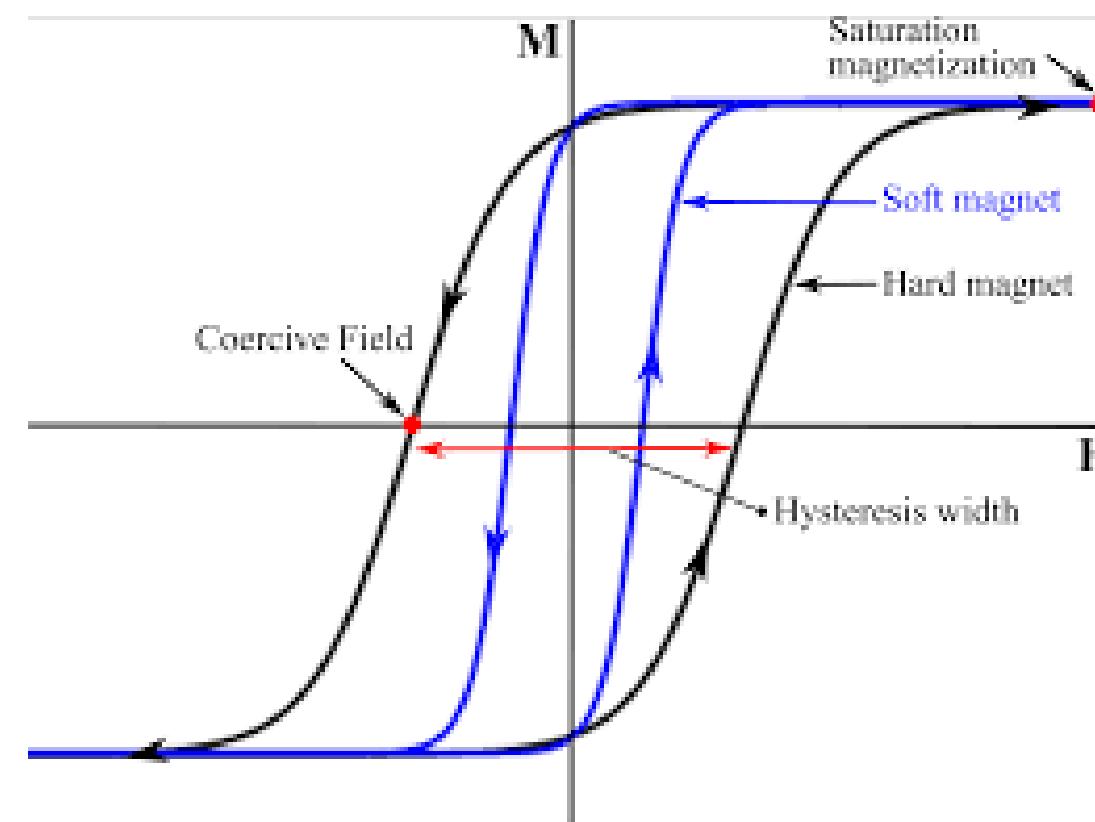


# ● Coercive field

- It is the strength of applied magnetic field ( $H$ ) required to demagnetize a ferromagnetic material.
- For a permanent magnet, we want the coercive field to be large.



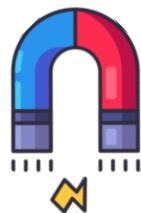
- Coercivity depends on how fast we change the magnetic field (annealing time).
- The coercive field reduces as we increase the temperature, going to 0 as the material transitions to paramagnetism.



# RESULTS & DISCUSSION

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- System Size, 2D and 3D Analysis
- Coupling Constant Analysis
- Anti-ferromagnetism
- Arbitrary Spin Direction in 2D



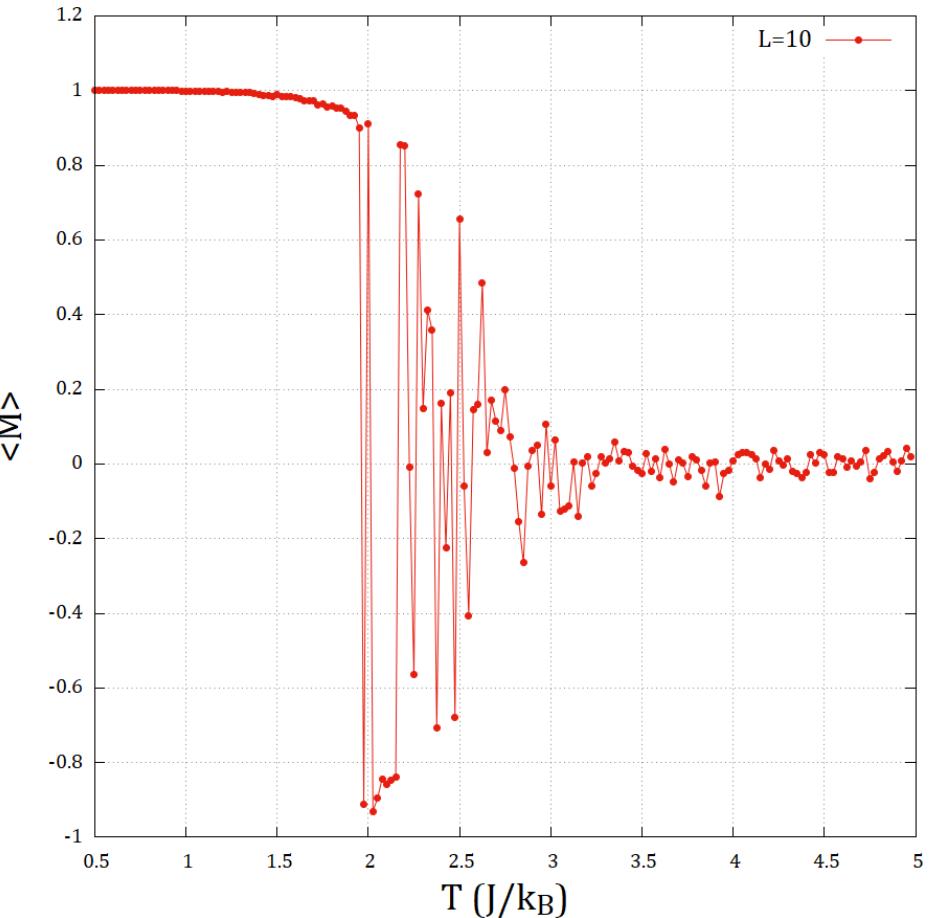
# ● System Size and 2D Analysis

As we increase the system size the fluctuation near the Curie temperature ( $T_c$ ) decreases.

That let's get more precise value of Curie temperature ( $T_c$ ).

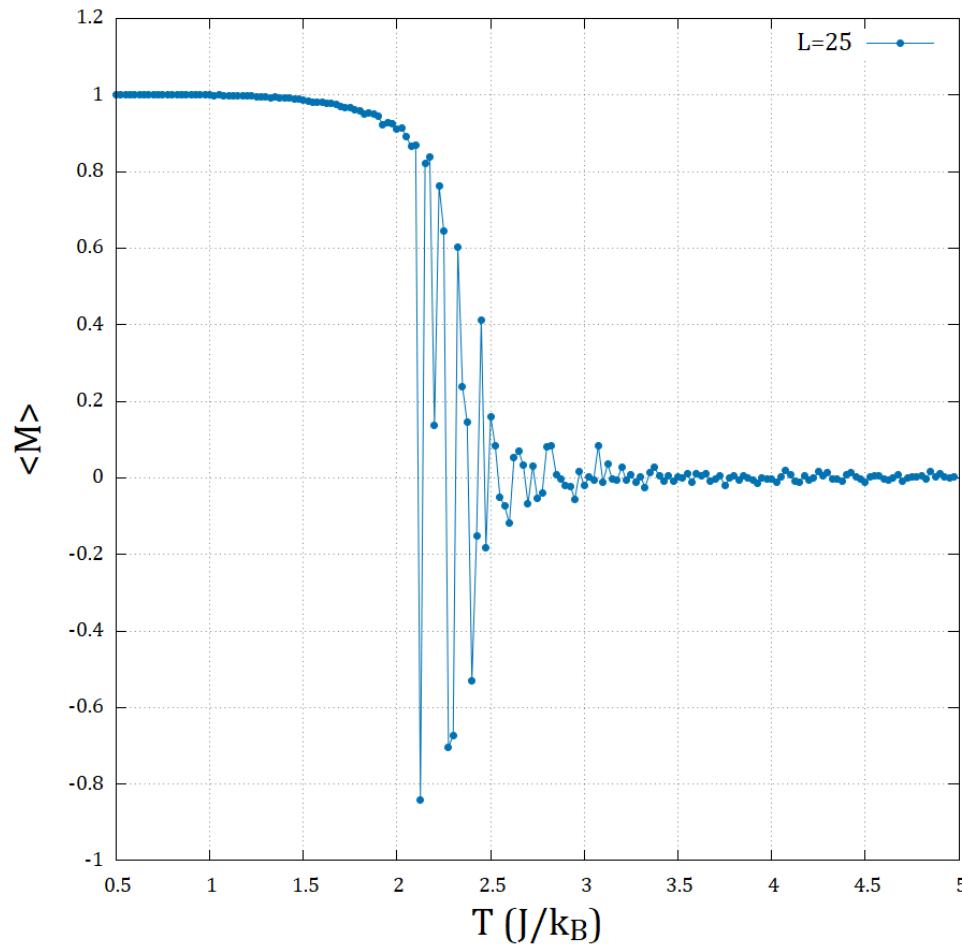
Another way to find Curie temperature ( $T_c$ ) when  $M$  goes to zero is by interpolation.

Average Magnetization with temperature | L=10

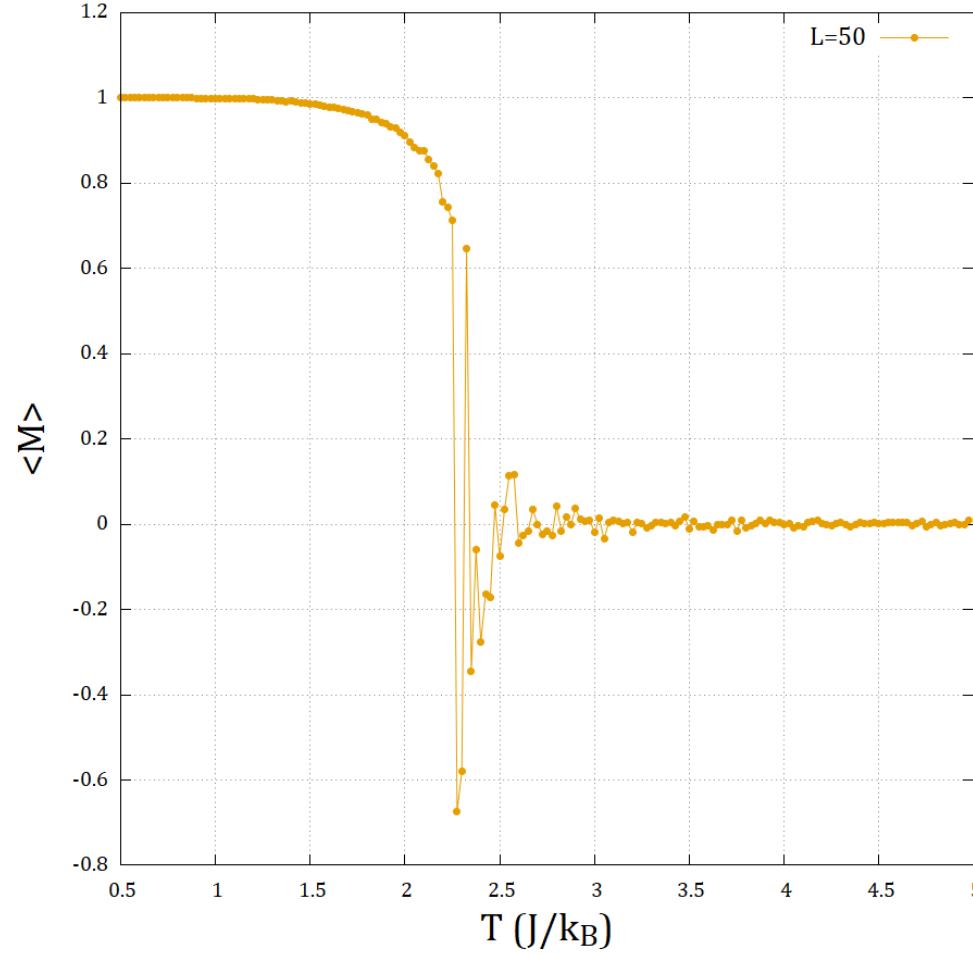




Average Magnetization with temperature | L=25



Average Magnetization with temperature | L=50



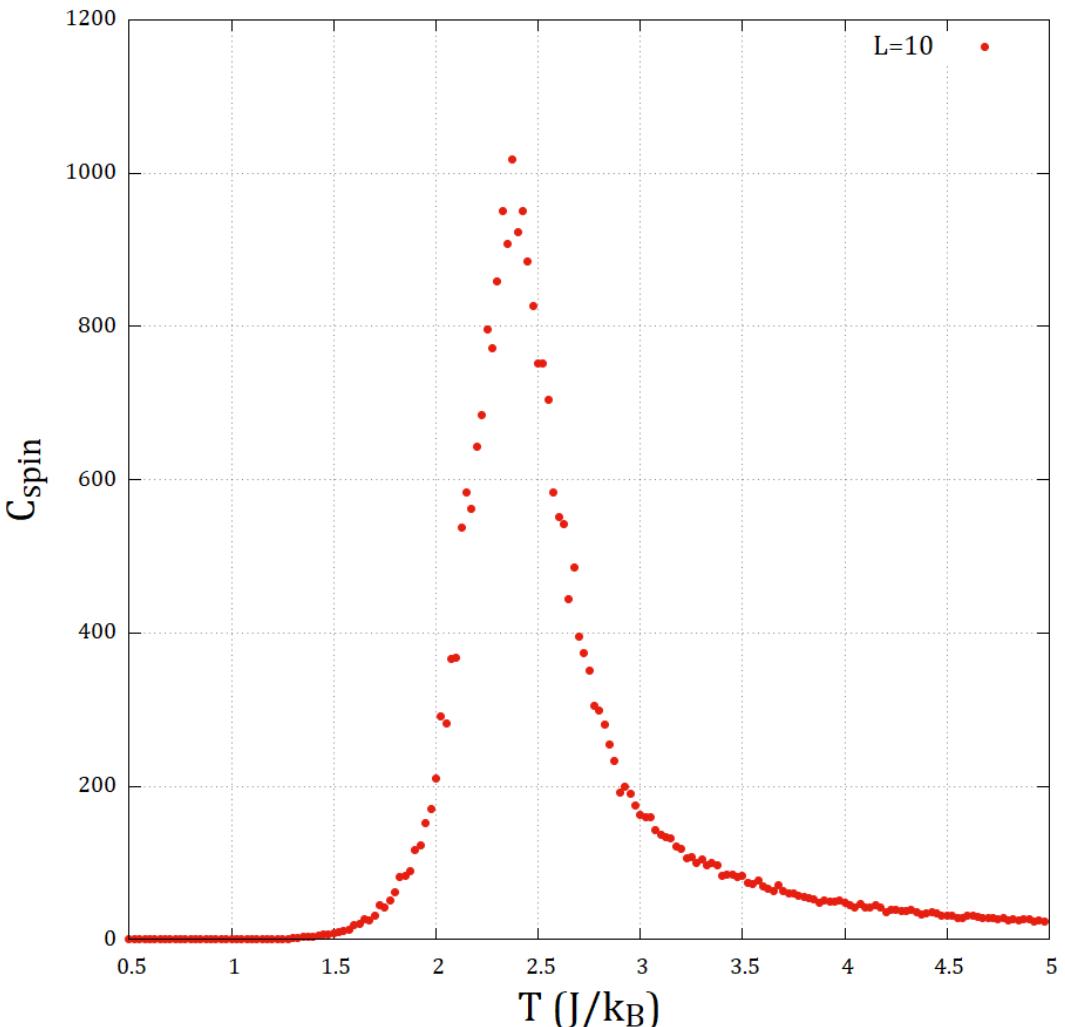
# ● System Size and 2D Analysis

## HEAT CAPACITY vs TEMPERATURE C vs. T

In Ising model, Specific heat capacity per spin is given by:

$$C_{spin} = \frac{(\Delta E)^2}{k_B T^2} = \frac{C}{L^2}$$

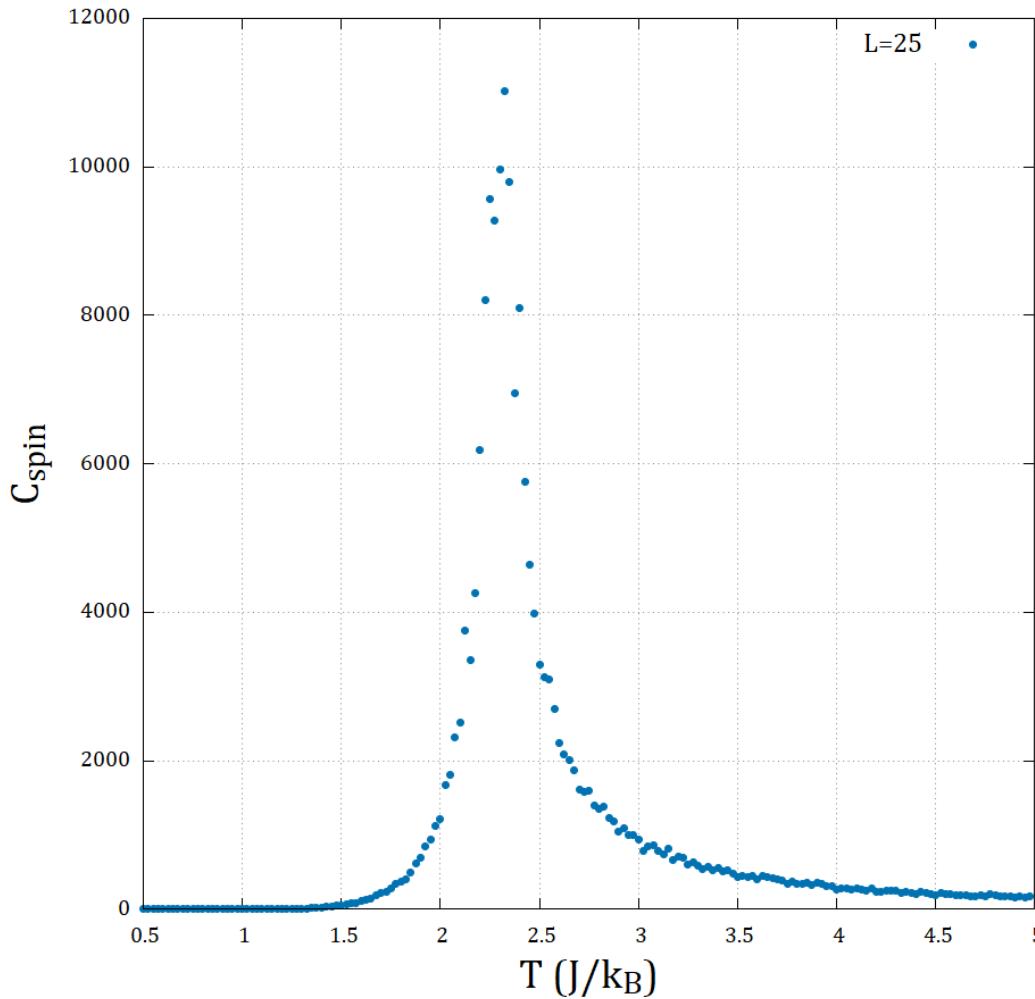
Specific heat per spin with temperature



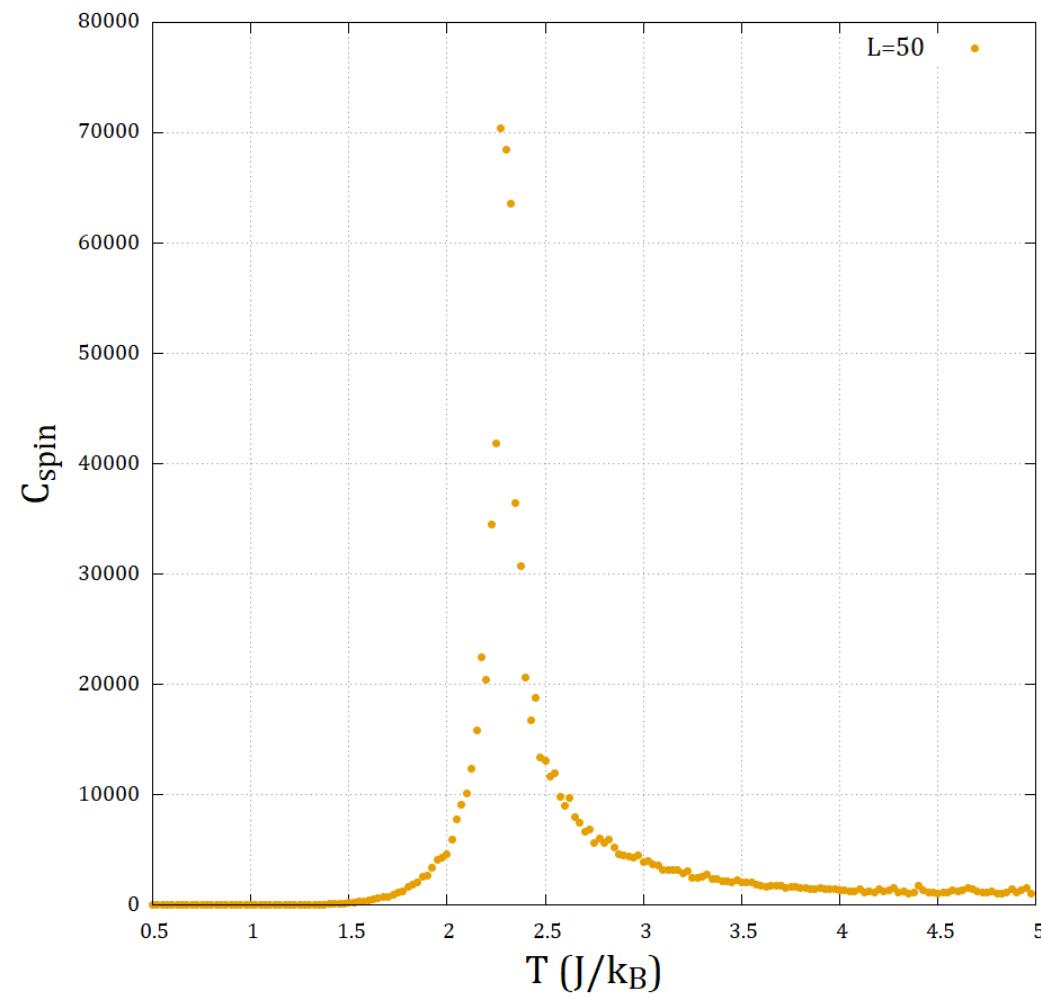


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Specific heat per spin with temperature



Specific heat per spin with temperature

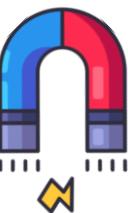
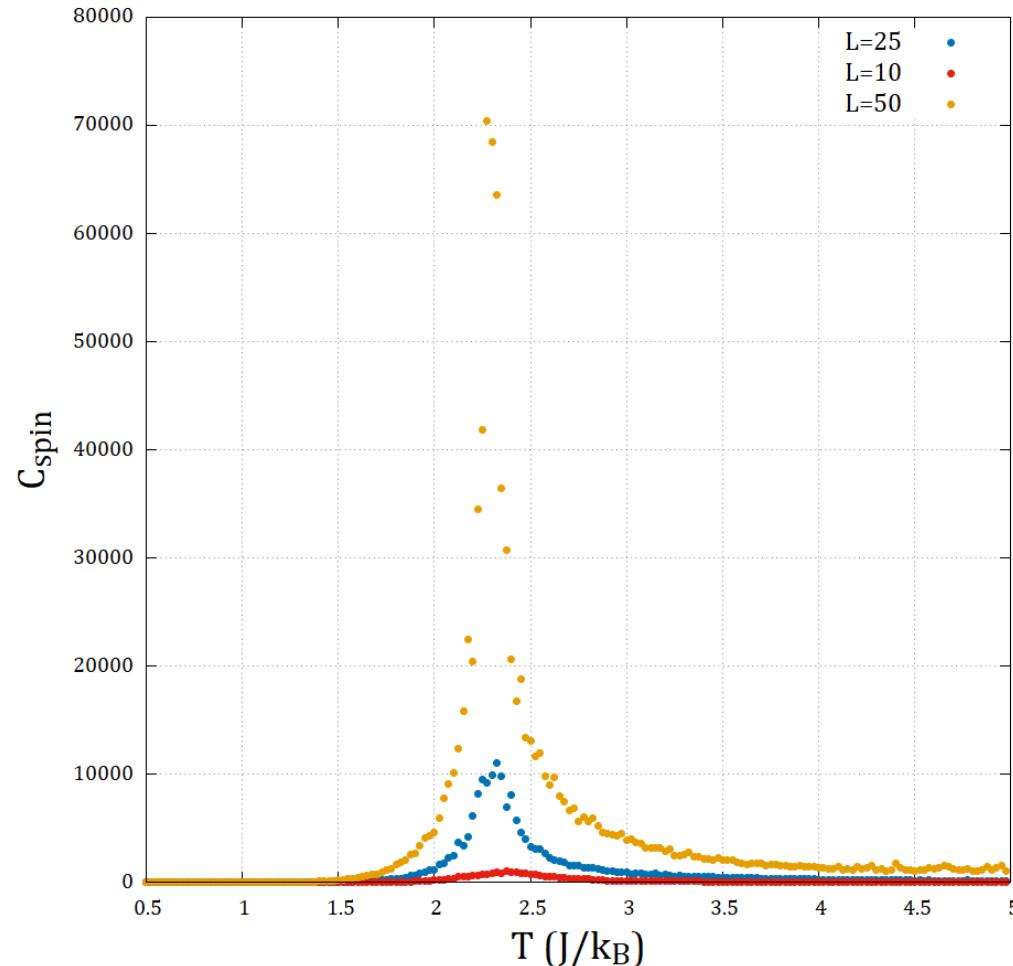


# ● System Size and 2D Analysis

As we **increase the system size (L)** the specific heat **capacity** diverges to **infinity** at the Curie temperature ( $T_c$ ).

And the fluctuations decreases with increasing system size (L).

Specific heat per spin with temperature

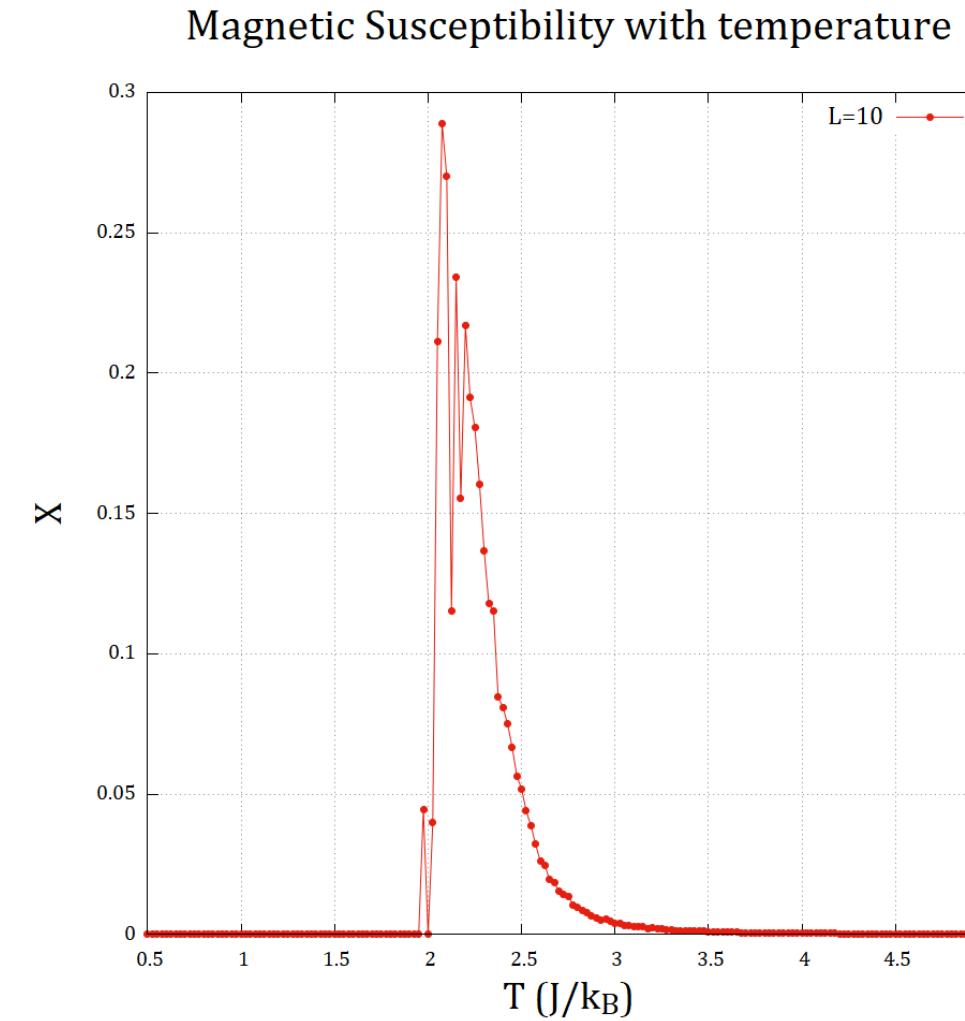


# ● System Size and 2D Analysis

## SUSCEPTIBILITY vs TEMPERATURE X vs. T

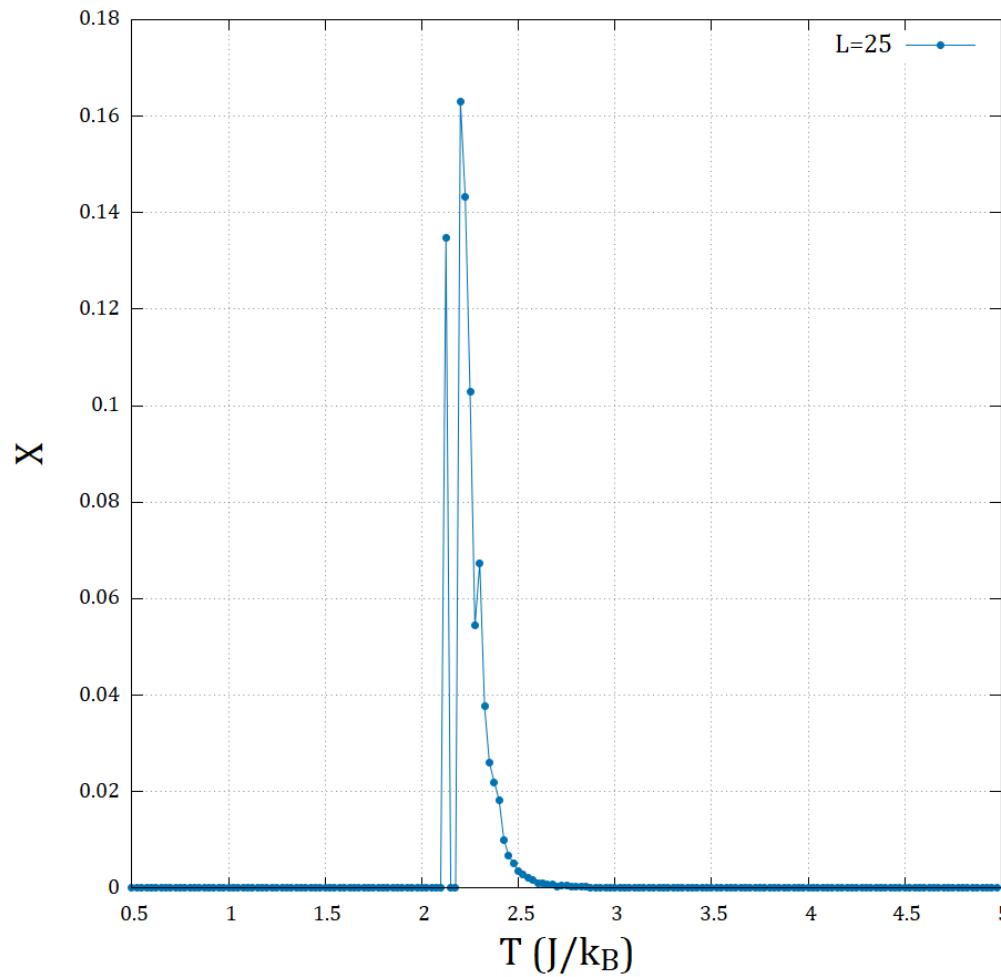
In Ising model, magnetic susceptibility is given by:

$$\chi = \frac{(\Delta M)^2}{k_B T}$$

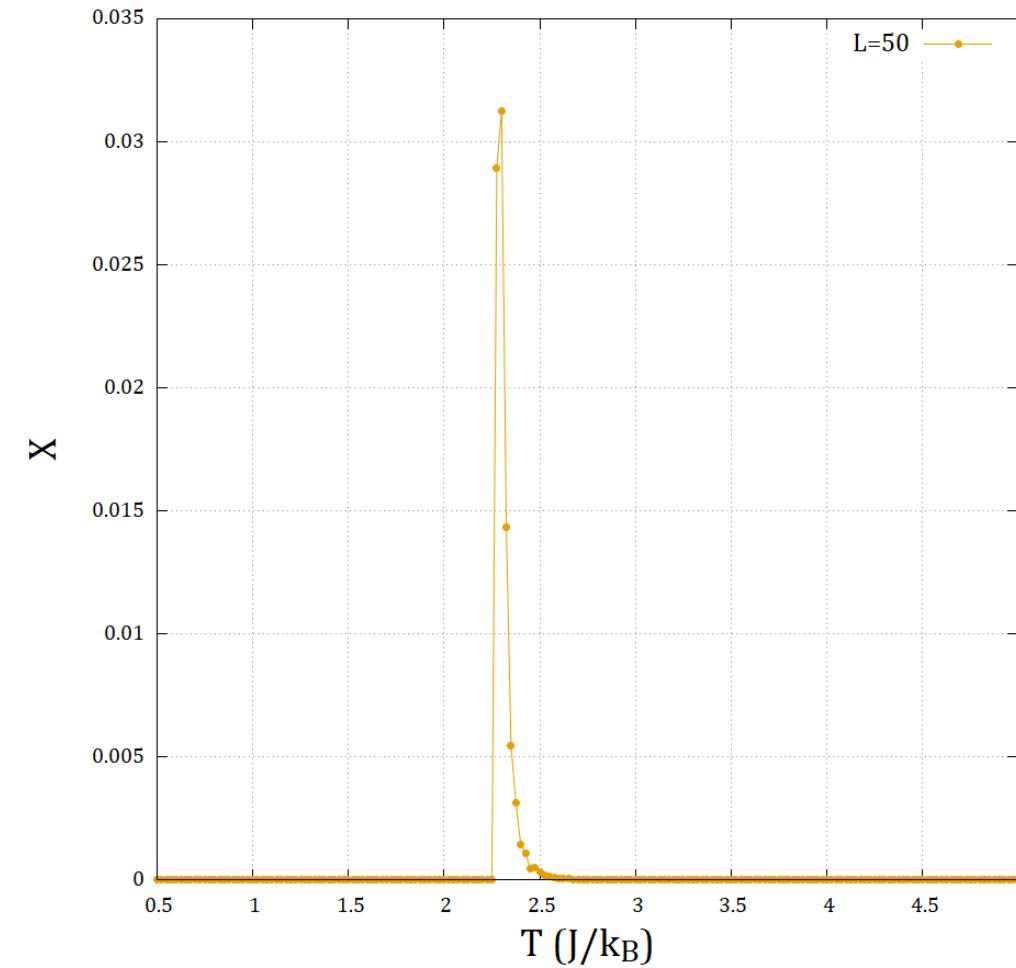




Magnetic Susceptibility with temperature



Magnetic Susceptibility with temperature



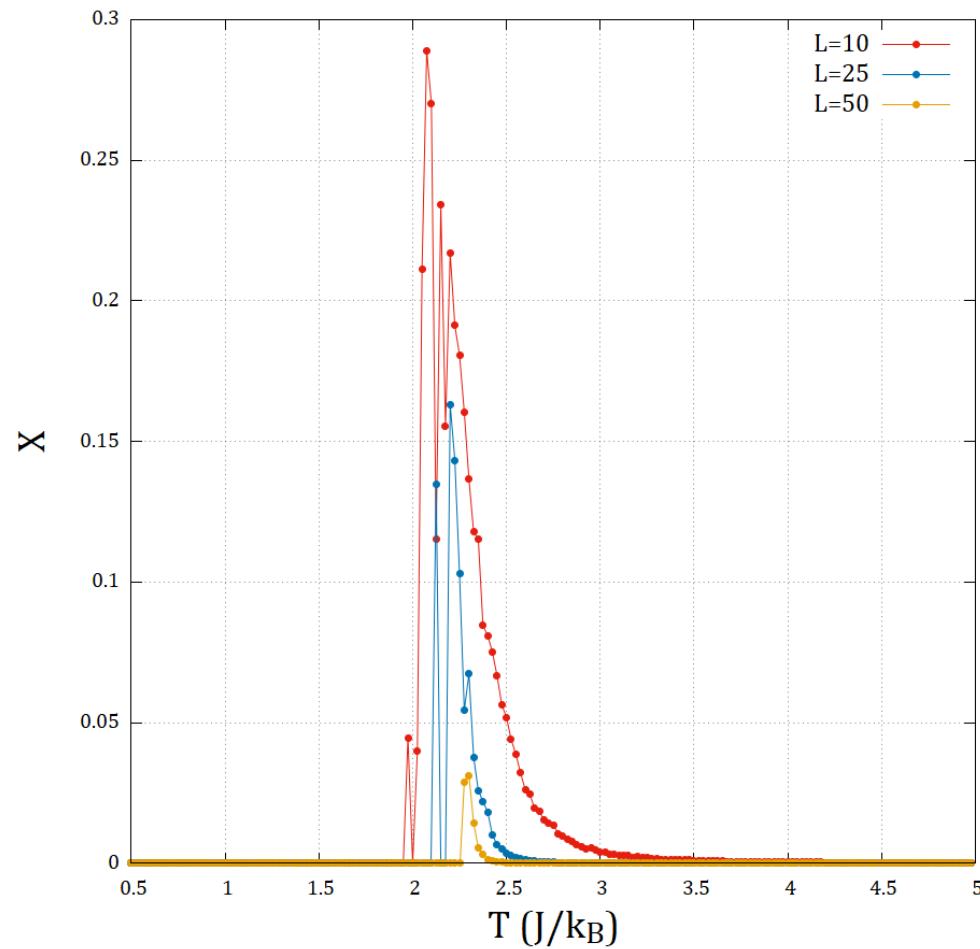
# ● System Size and 2D Analysis

As we **increase the system size (L)** the magnet susceptibility **diverges** to **infinity** at the Curie temperature ( $T_c$ ).

Magnet susceptibility decreases faster with increasing system size

And the fluctuations decreases with increasing system size (L).

Magnetic Susceptibility with temperature

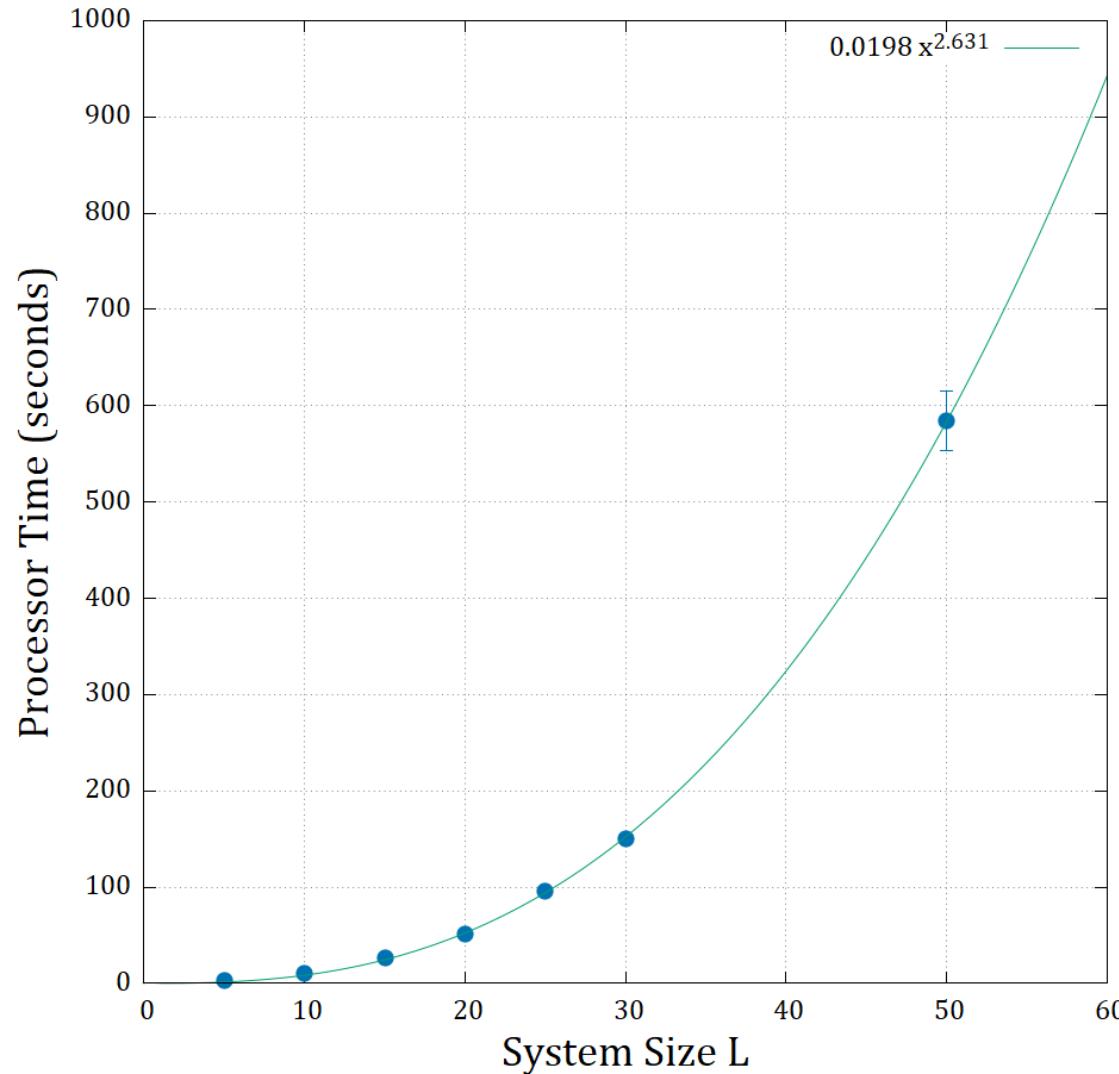


# ● System Size and 2D Analysis

- Analyzing runtime with growing system sizes, we found that the 2D Ising model scales as a polynomial function of system size ( $L$ )

$$\text{Runtime}(L) = 0.0198x^{2.631}$$

Run Time with System Size | 2D Ising model



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# ● System Size and 3D Analysis

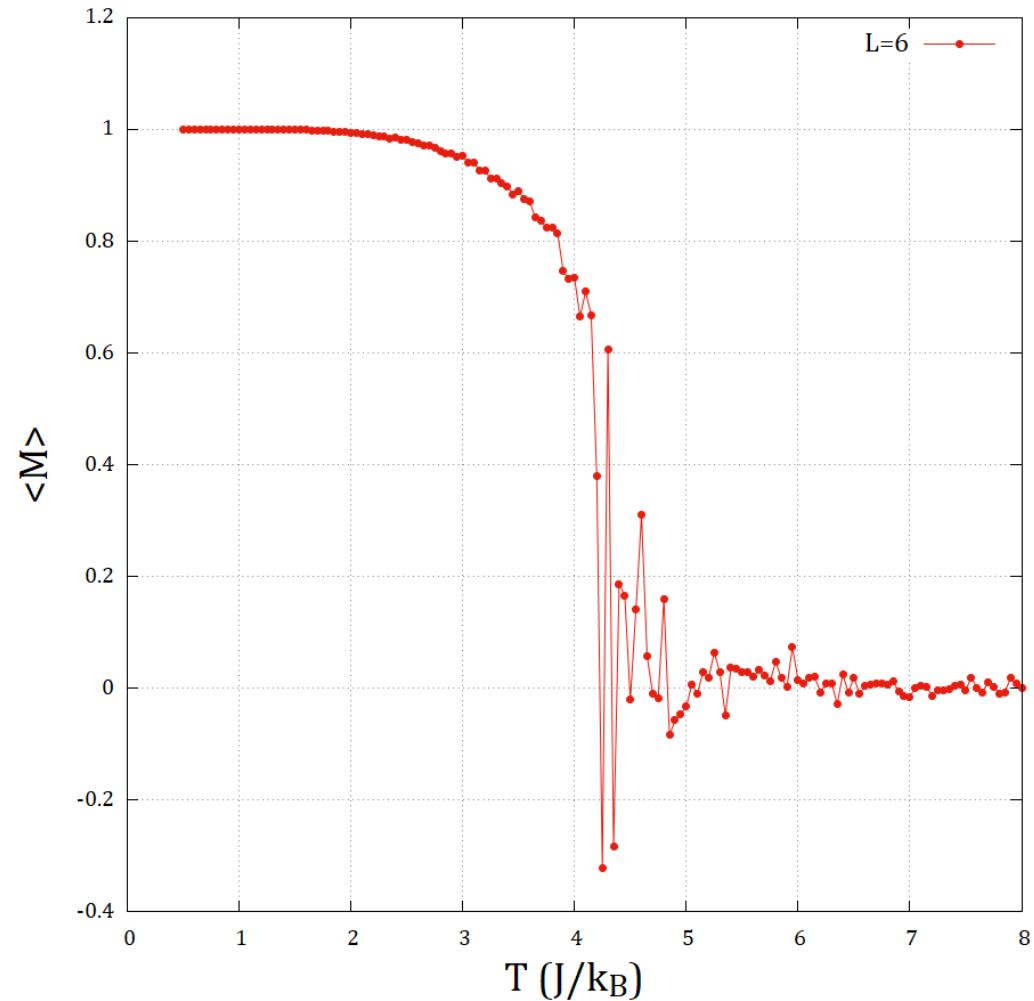
## MAGNETIZATION vs TEMPERATURE $\langle M \rangle$ vs. T

The behavior is identical to 2D.

The [Curie temperature](#) ( $T_c$ ) is around 4.5 J/kB which is higher than in 2D.

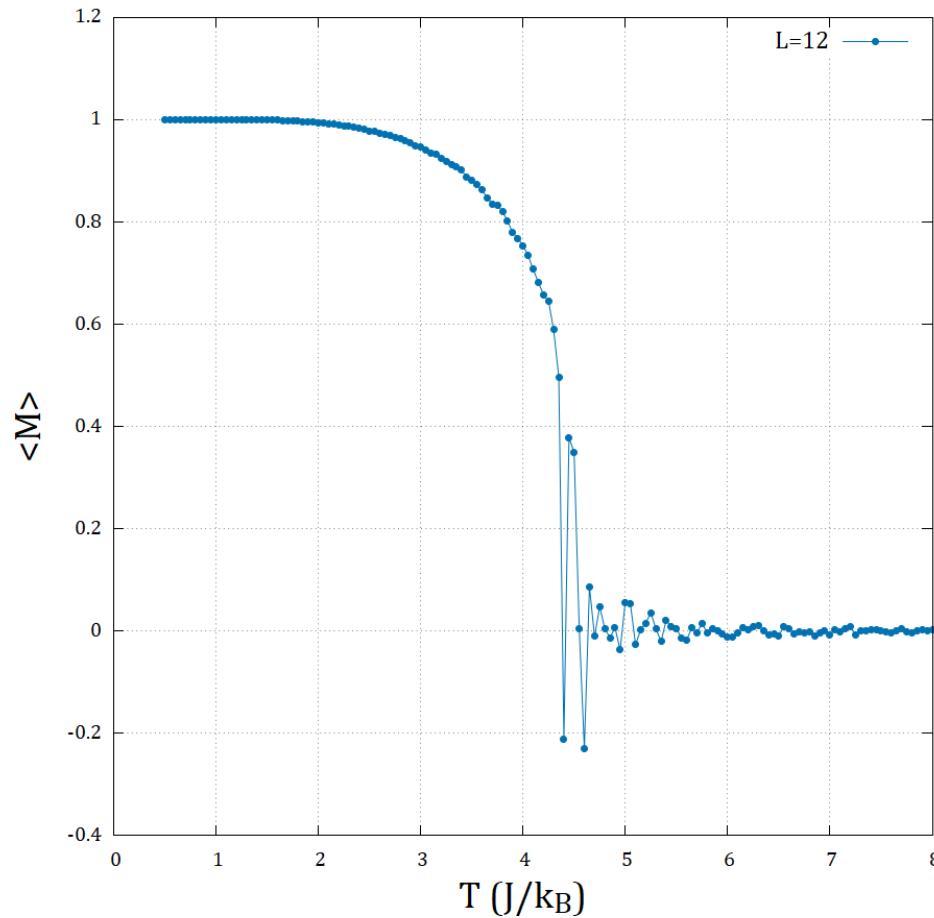
Because in 3D the number of nearest neighbors is higher.

Average Magnetization vs temperature | 3D System

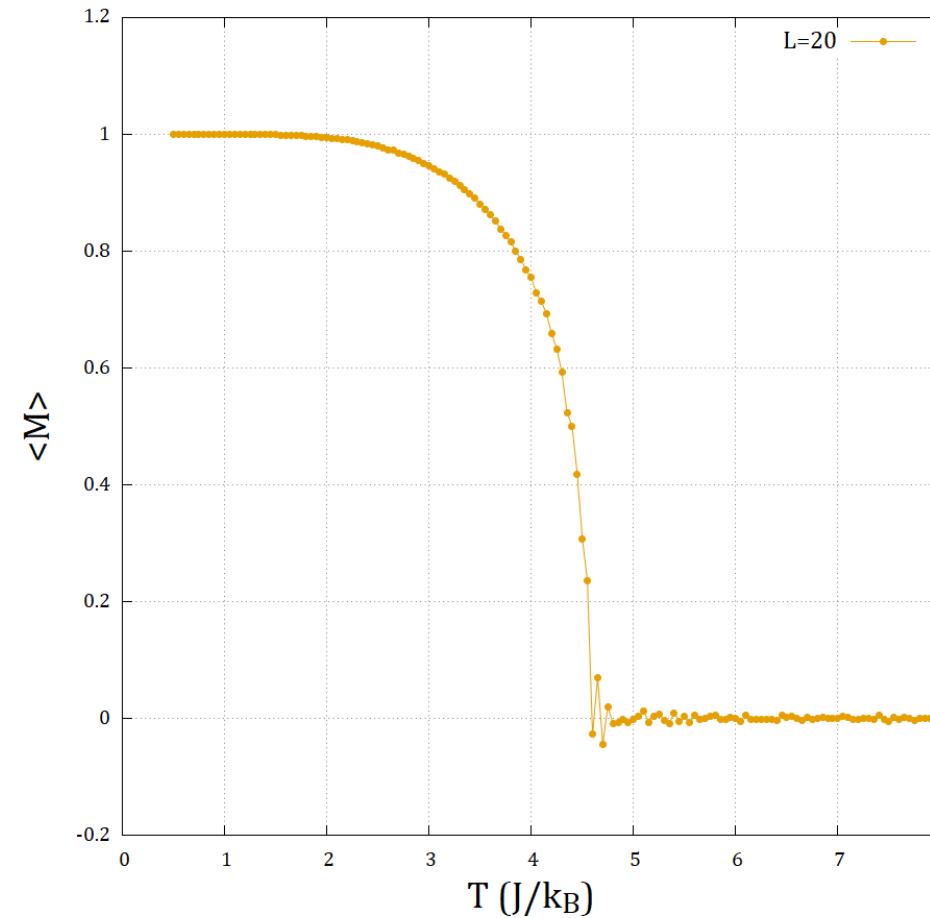




Average Magnetization vs temperature | 3D System



Average Magnetization vs temperature | 3D System

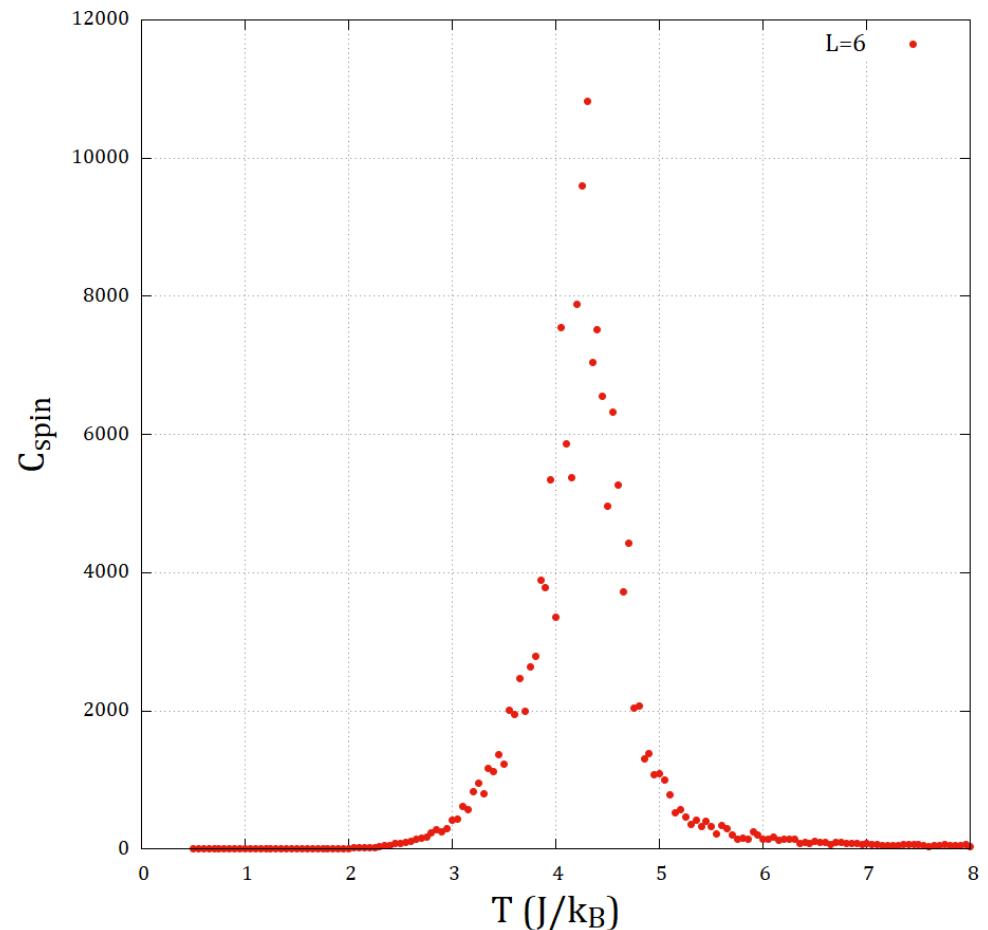


# ● System Size and 3D Analysis

## HEAT CAPACITY vs TEMPERATURE C vs. T

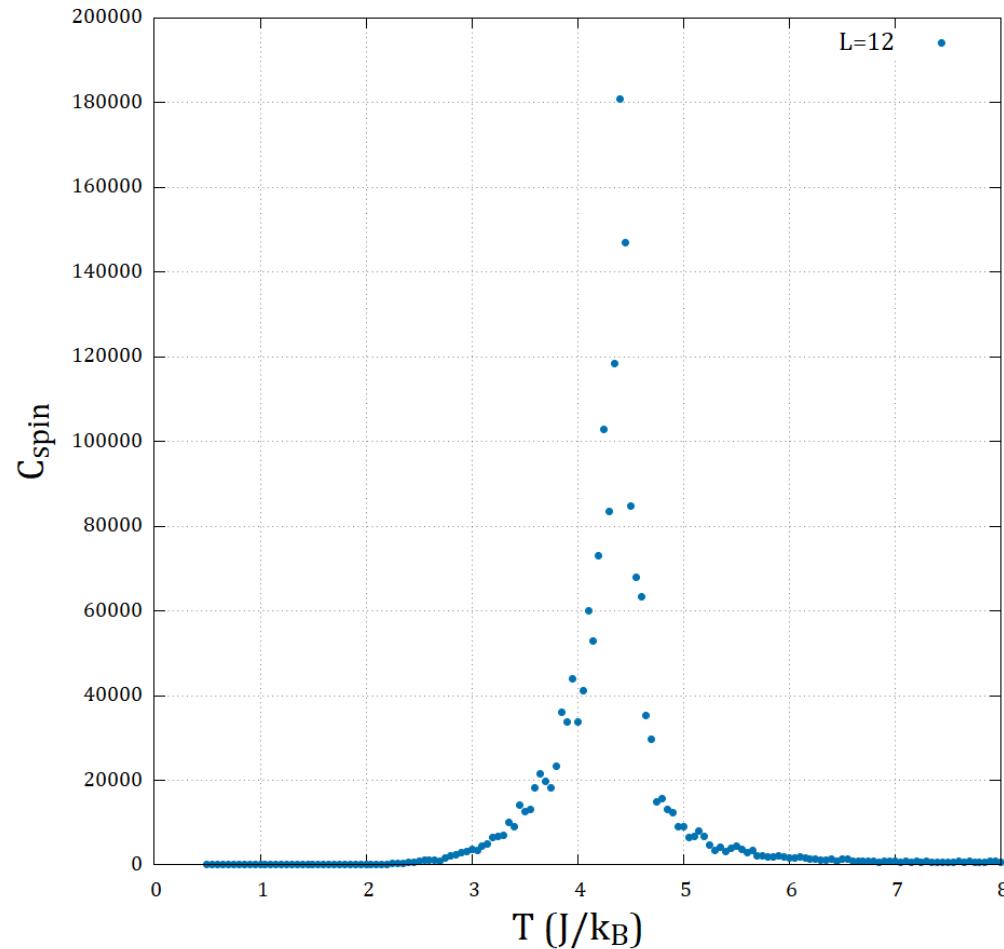
The behavior is identical to 2D.  
The [Curie temperature](#) ( $T_c$ ) is around 4.5 J/kB which is higher than in 2D.

Specific heat per spin vs temperature | 3D System

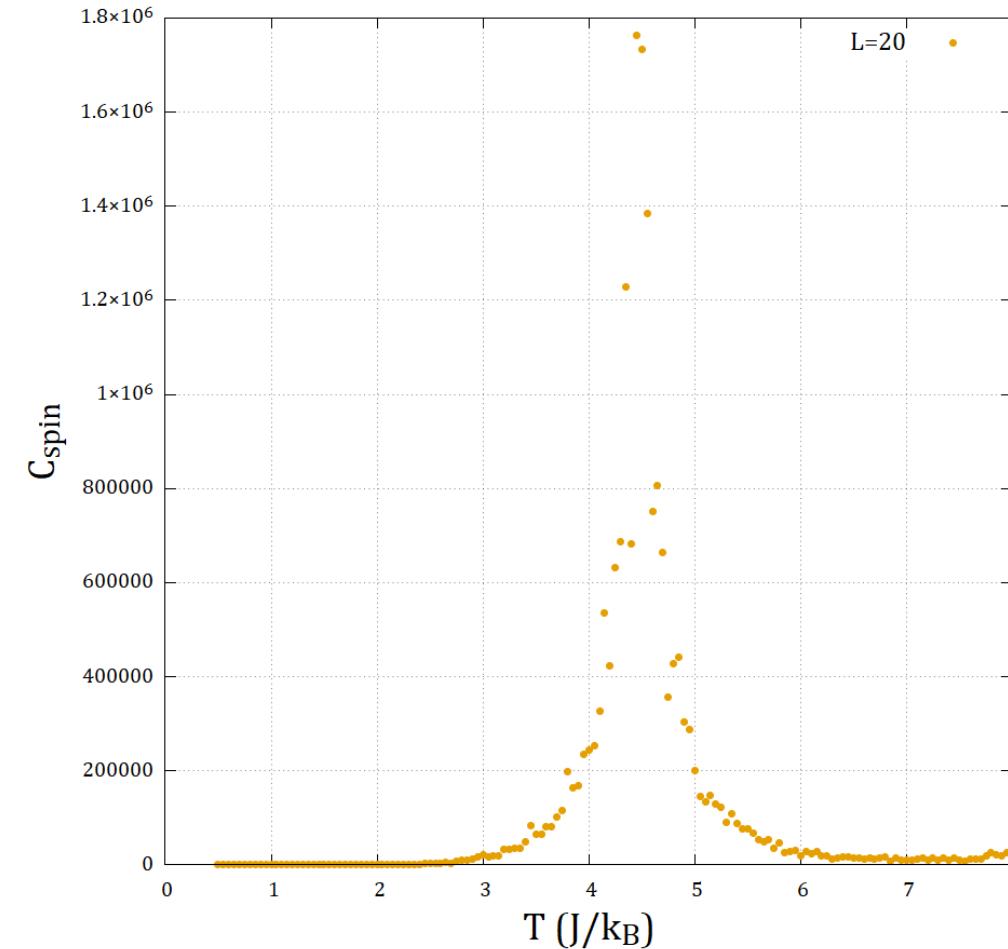




Specific heat per spin vs temperature | 3D System



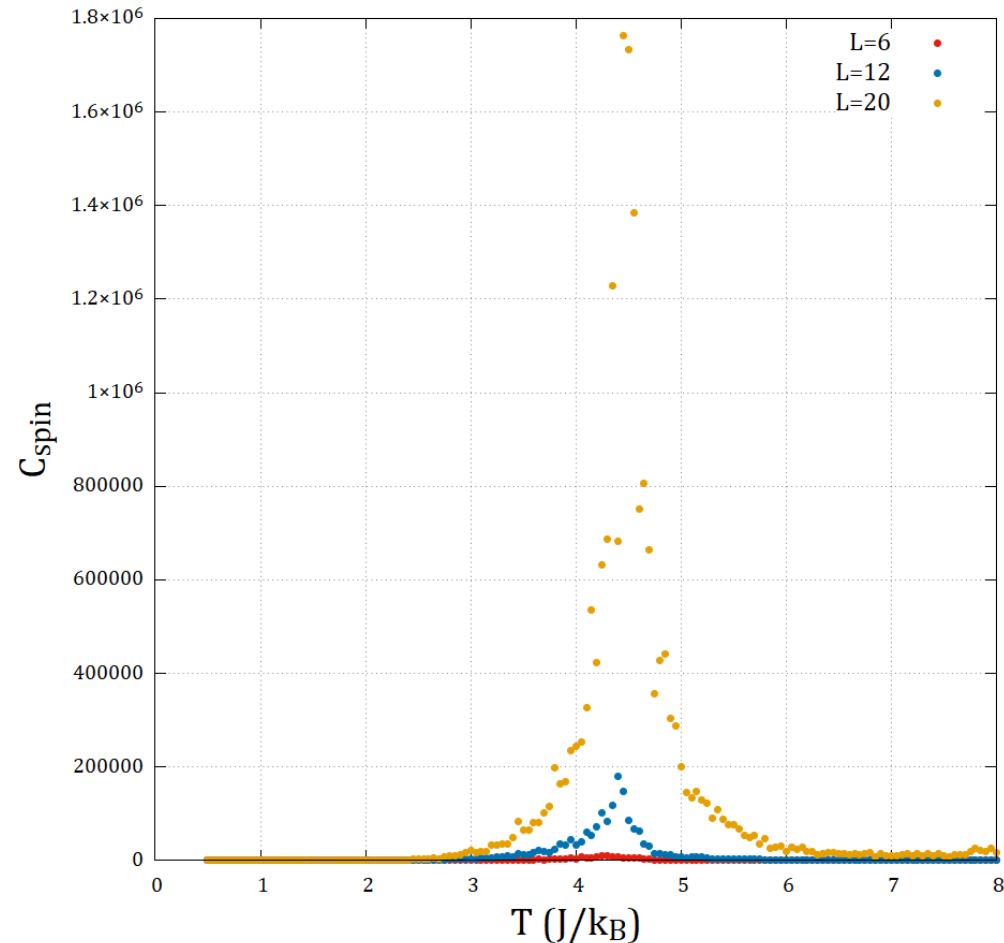
Specific heat per spin vs temperature | 3D System



# ● System Size and 3D Analysis

The noise is less than 2D.

Specific heat per spin vs temperature | 3D System

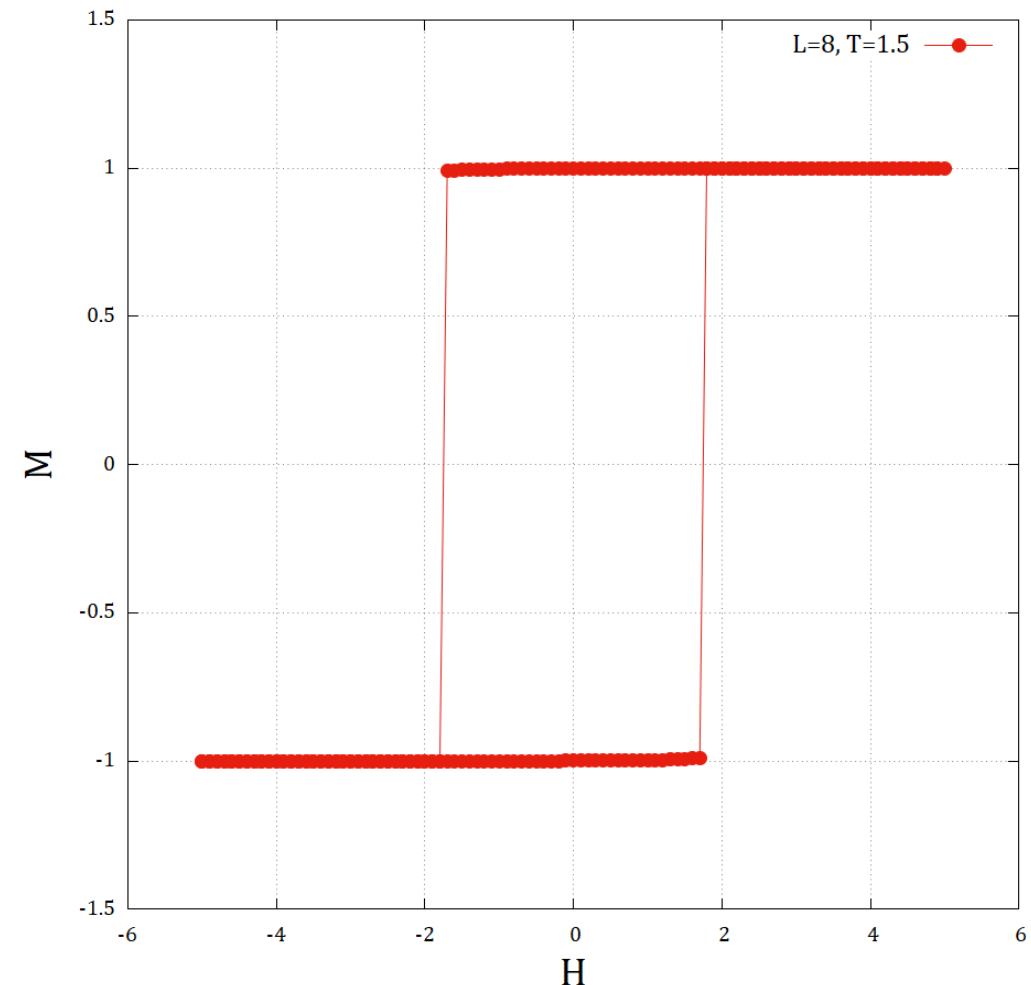


# ● System Size and 3D Analysis

## HYSTERESIS LOOP $\langle M \rangle$ vs. B

There is hysteresis loop in 3D. The same as 2D.

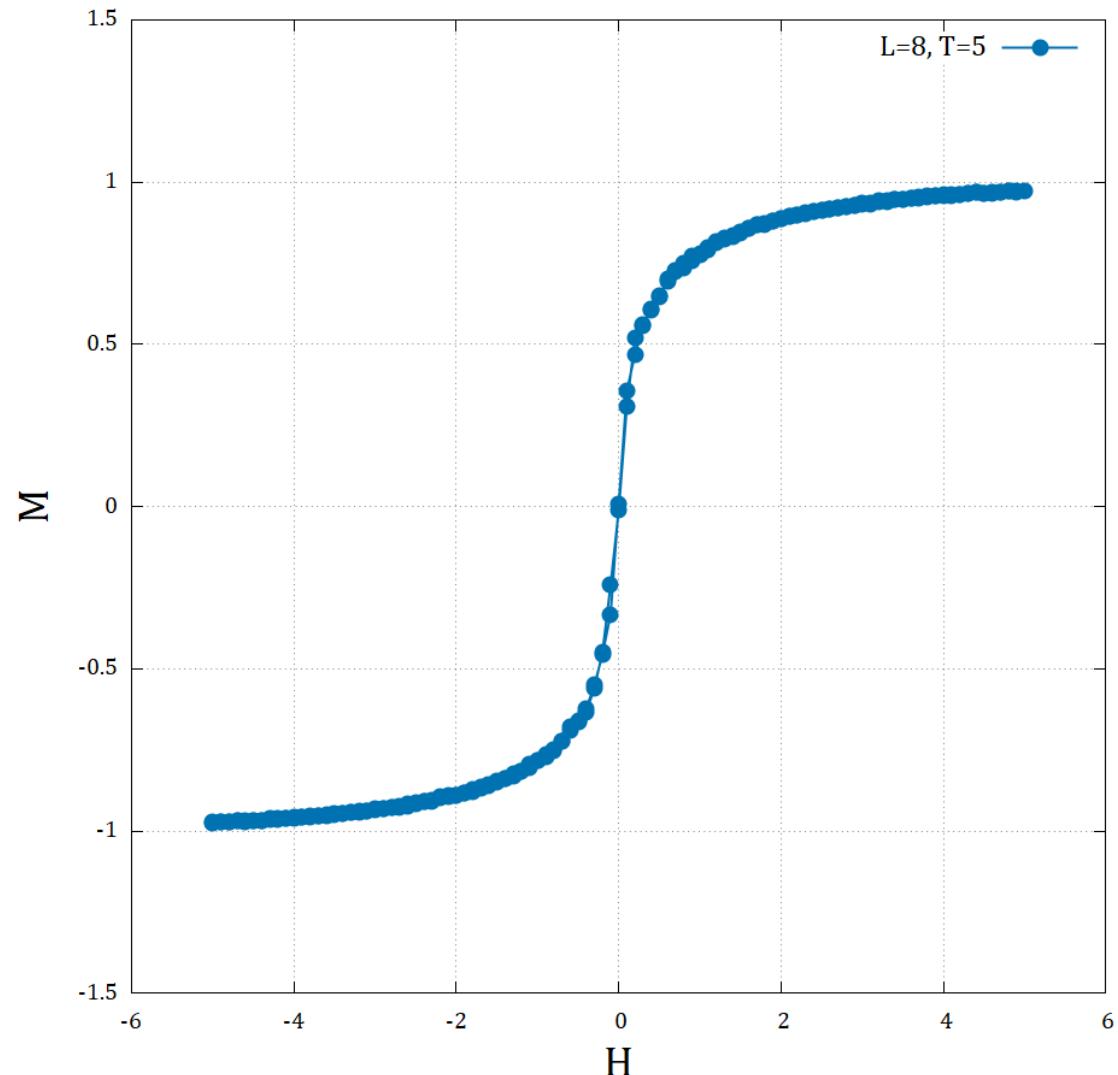
Hysteresis Loop,  $T < T_c$  | 3D Ising Model





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## Hysteresis Loop, $T > T_C$ | 3D Ising Model



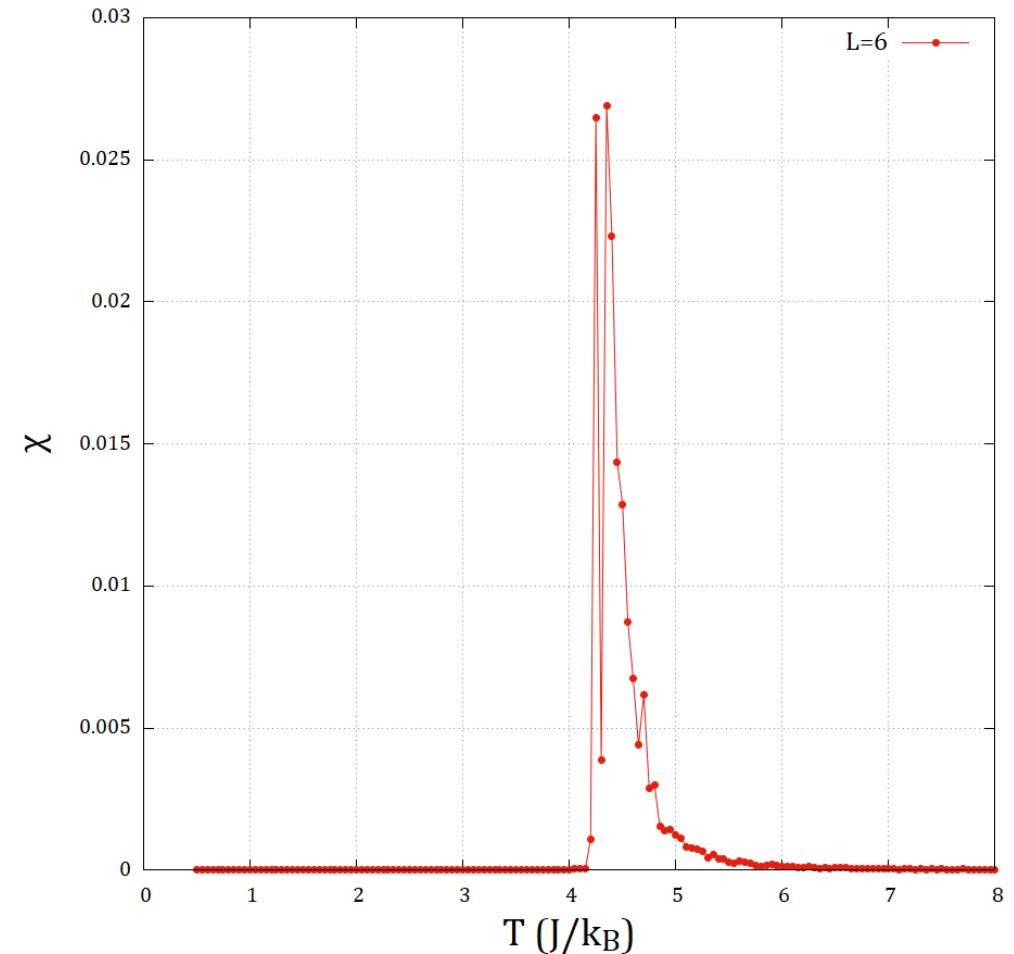
# ● System Size and 3D Analysis

## SUSCEPTIBILITY vs TEMPERATURE $\chi$ vs. T

The behavior is similar to the 2D results

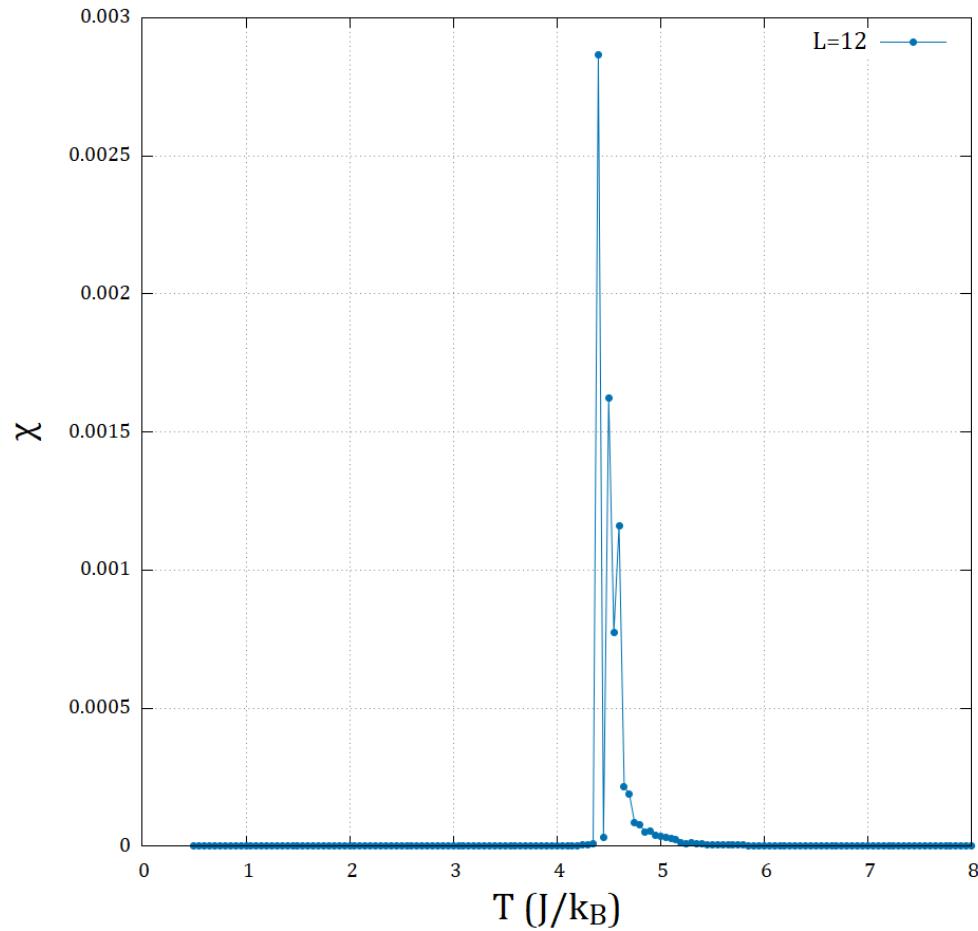
The susceptibility reduces with system size, while  $T_c$  increases.

Magnetic Susceptibility with temperature | 3D System

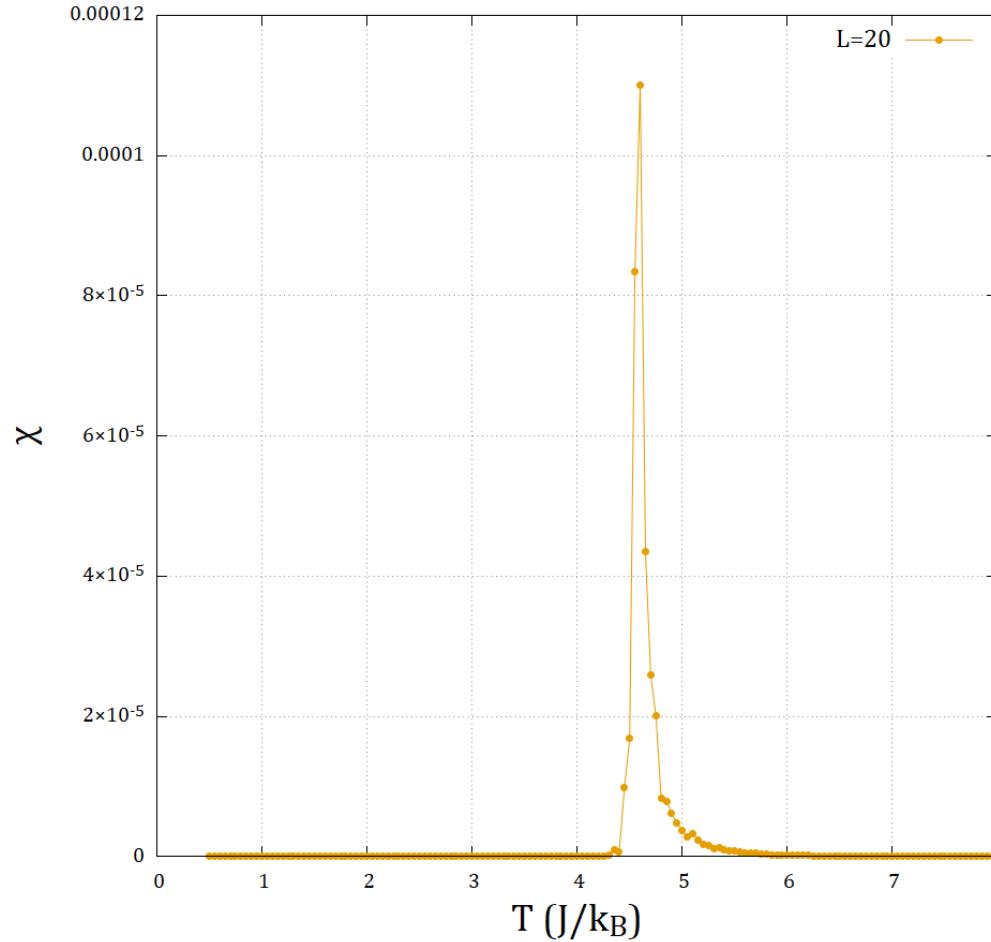




Magnetic Susceptibility with temperature | 3D System



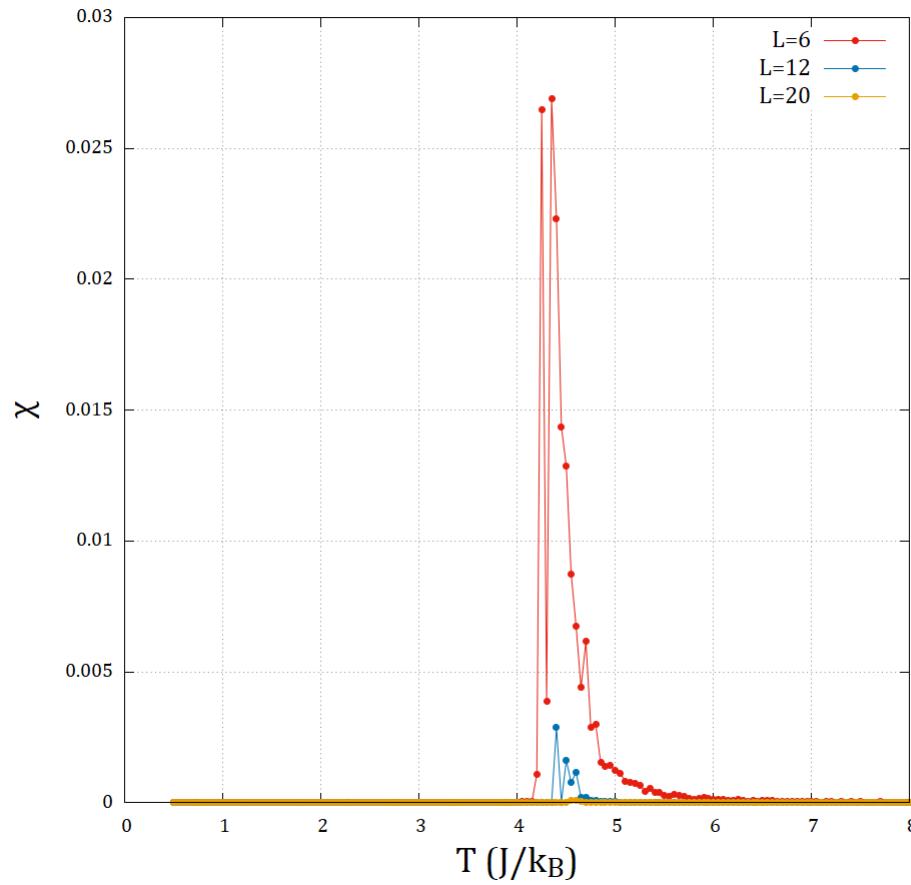
Magnetic Susceptibility with temperature | 3D System



# ● System Size and 3D Analysis

The Susceptibility decreases, while the Curie temperature increases marginally.

Magnetic Susceptibility with temperature | 3D System

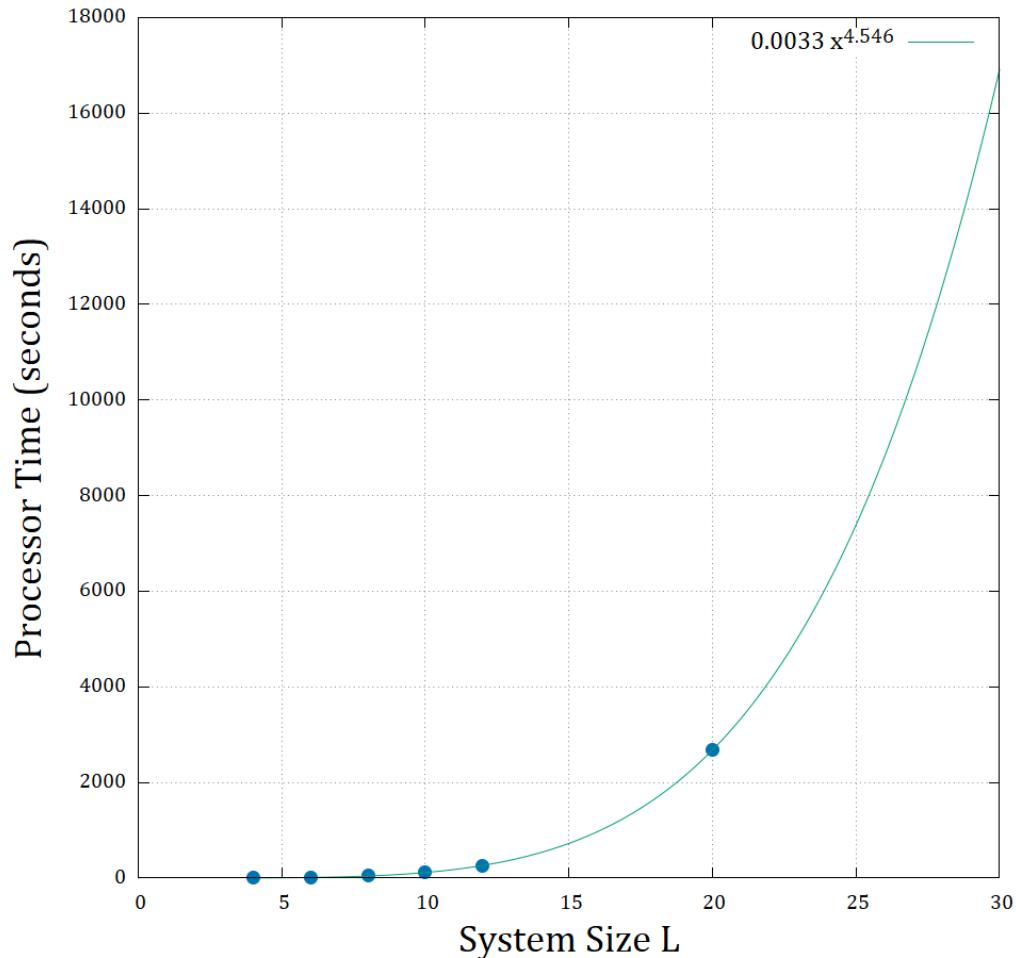


# ● System Size and 3D Analysis

- Analyzing runtime with growing system sizes, we found that the 3D Ising model scales as a polynomial function of system size ( $L$ )

$$\text{Runtime}(L) = 0.0033x^{4.546}$$

Run Time with System Size | 3D Ising Model



ME WHEN THE



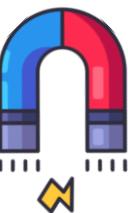
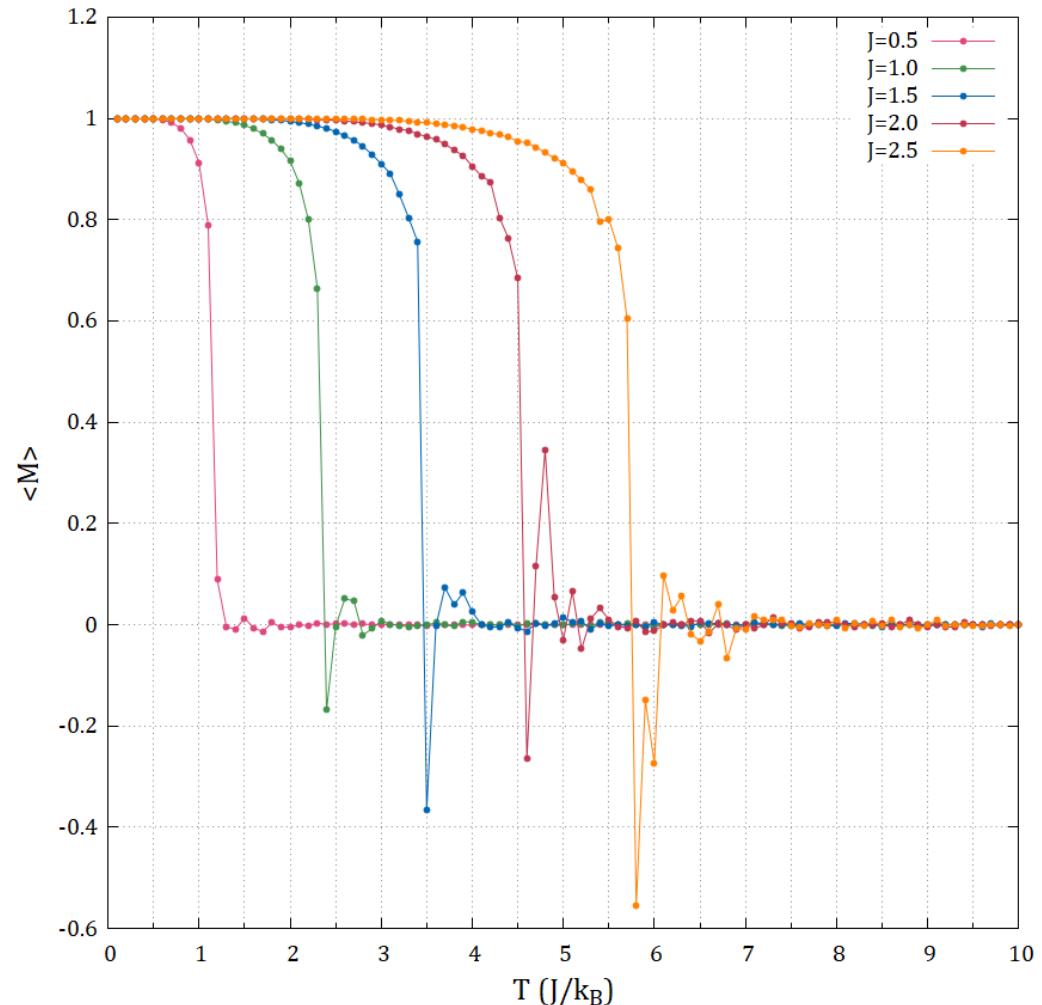
WHEN THE 3D  
ISING MODEL  
FINALLY STOPS RUNNING

# ● Coupling Constant Analysis

## MAGNETIZATION vs TEMPERATURE $\langle M \rangle$ vs. T

As we increases the coupling strength as the Curie temperature increases.

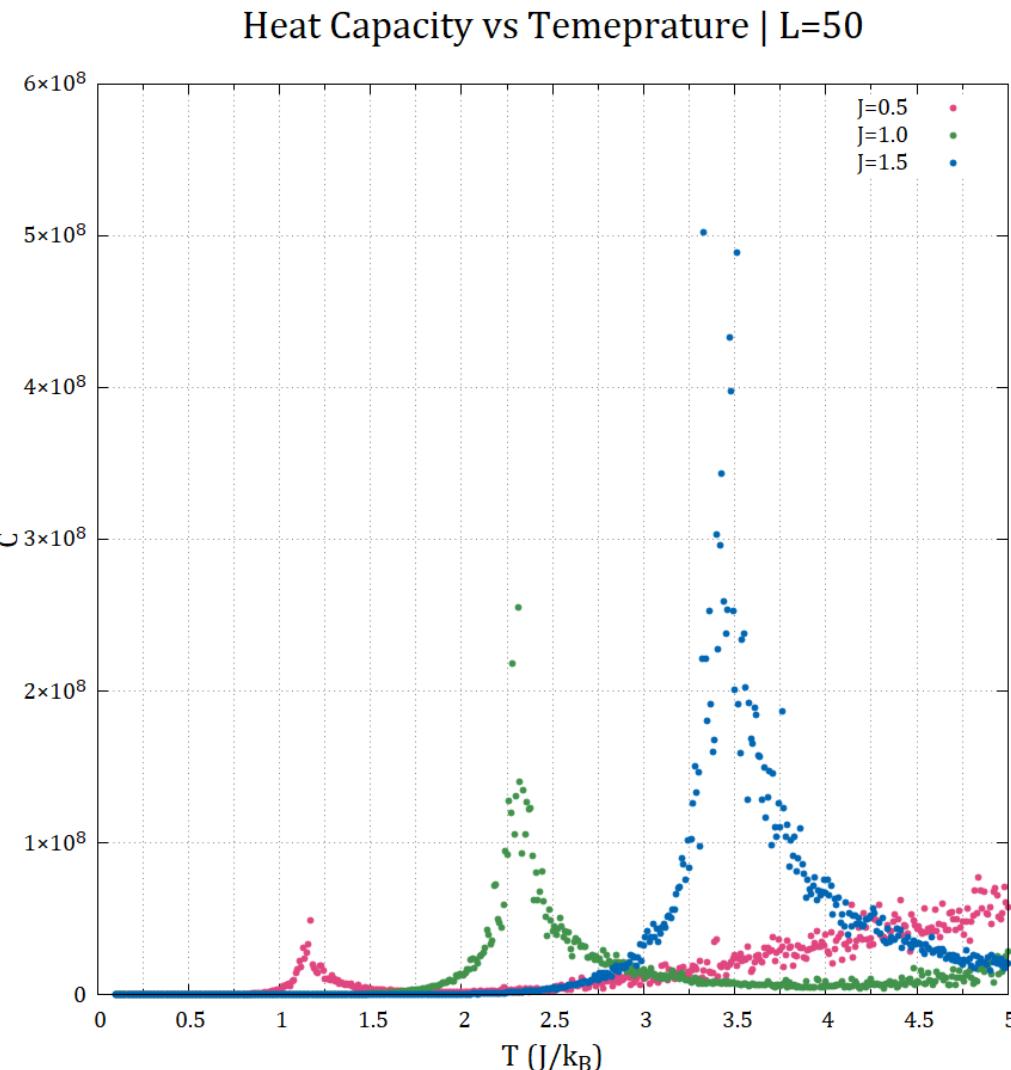
Magnetization vs Temperature | L=50



# ● Coupling Constant Analysis

## HEAT CAPACITY vs TEMPERATURE C vs. T

The results agree with the results of magnetization vs temperature.  
Which the Curie temperature increases by increasing the coupling strength.



# ● Coupling Constant Analysis

## SUSCEPTIBILITY vs TEMPERATURE $X$ vs. $T$

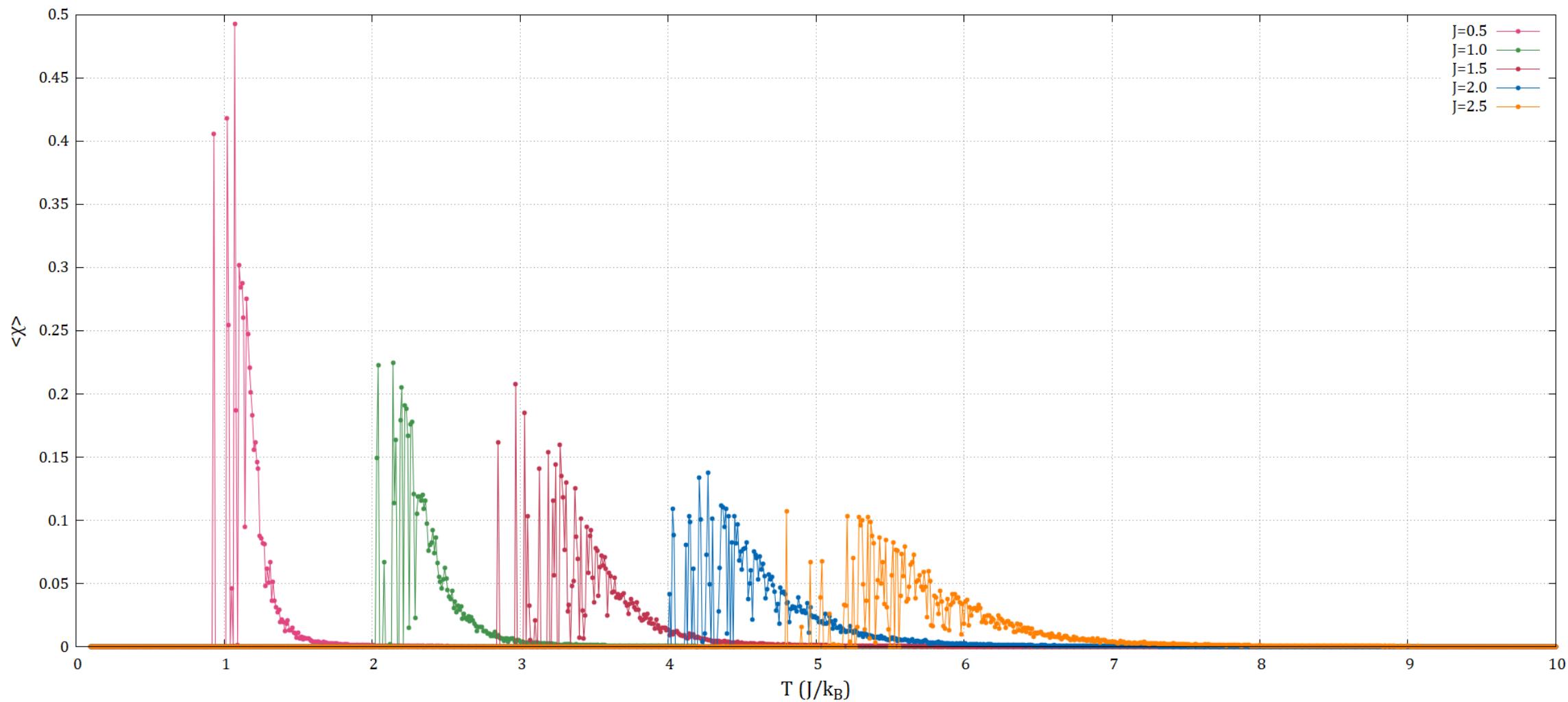
Again, the results agreed with the previous two.

You can notice that the singularity of the susceptibility shifts to the right.



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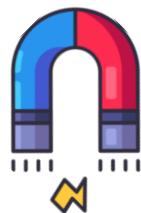
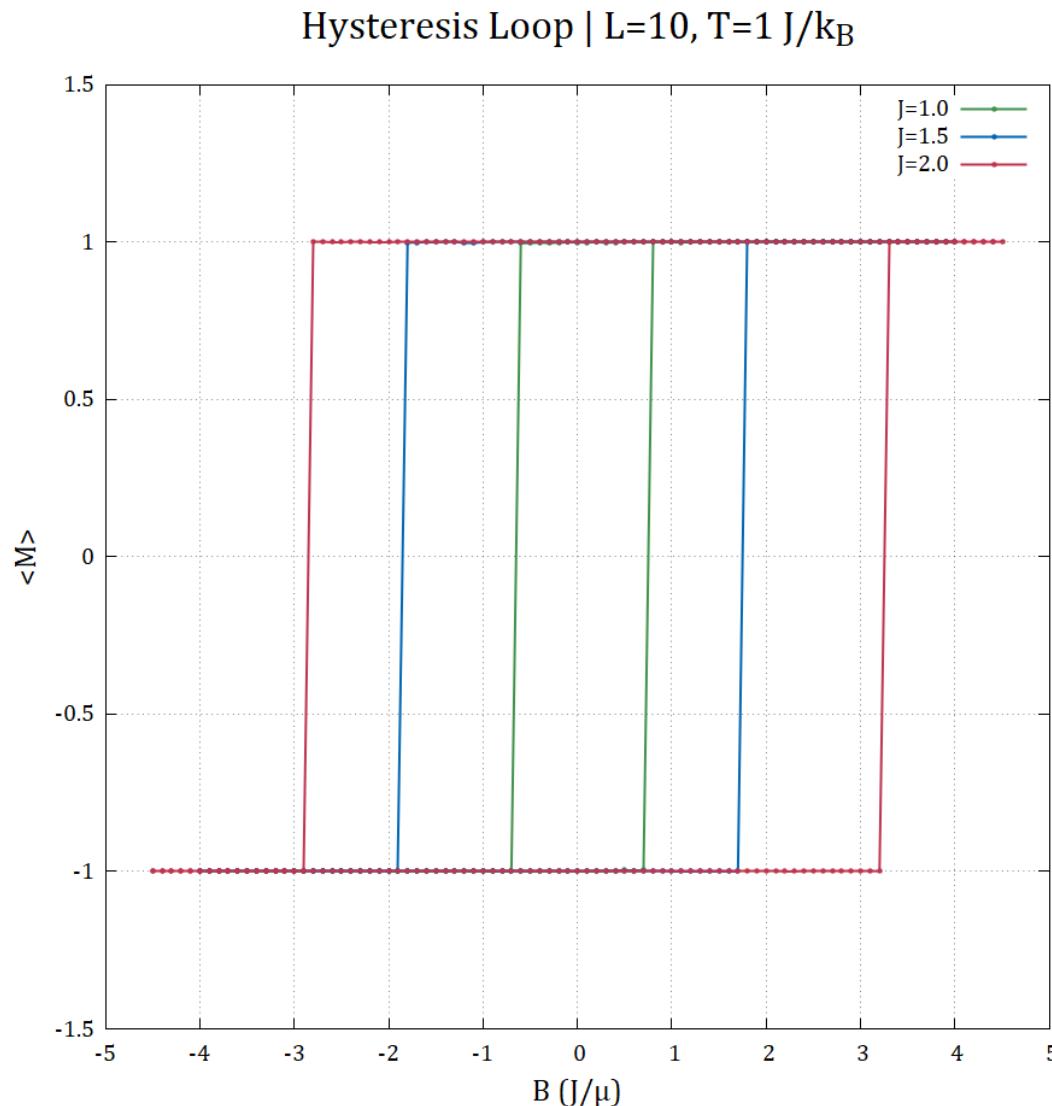
Magnetic Susceptibility vs Temperature



# ● Coupling Constant Analysis

## HYSTERESIS LOOP $\langle M \rangle$ vs. B

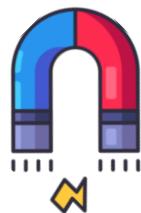
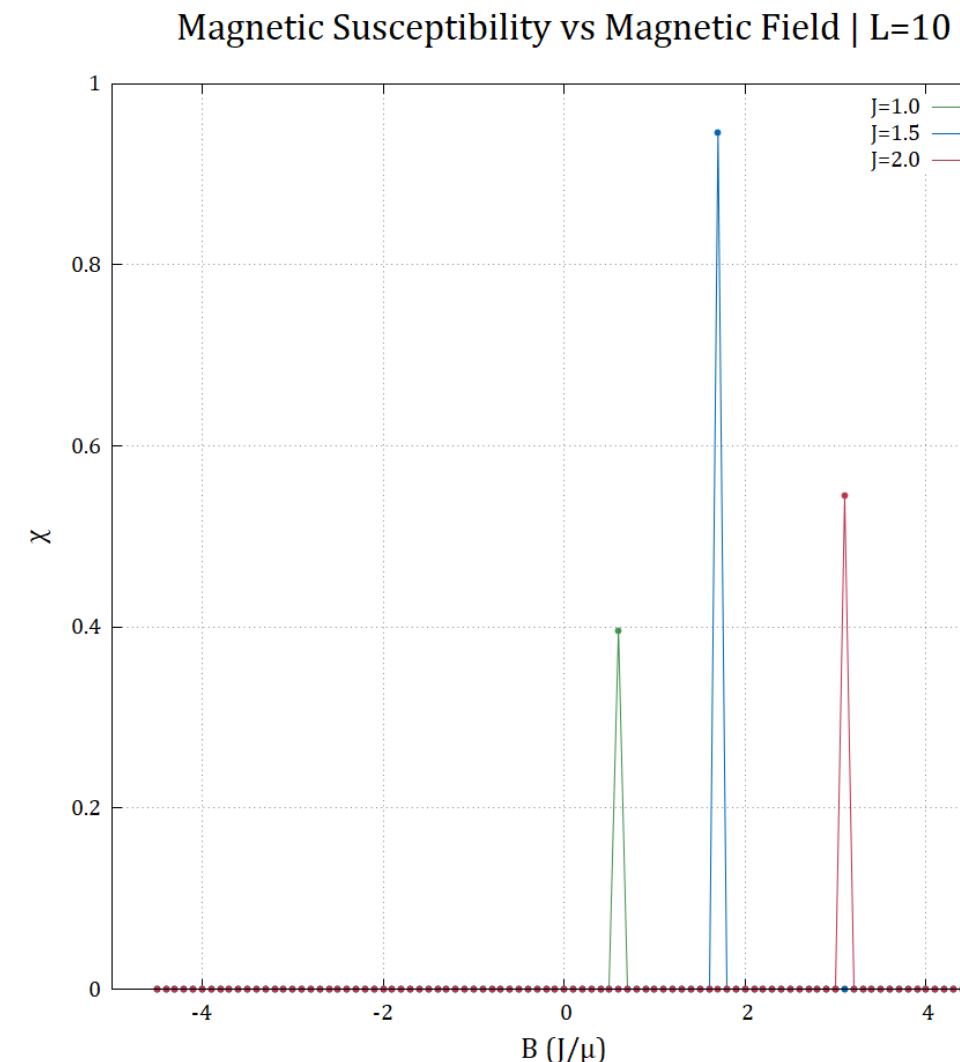
As the coupling constant increases, as the material becomes more ferromagnetic, that means it's highly magnetized. So, the coercive field is higher for higher coupling constant.



# ● Coupling Constant Analysis

## SUSCEPTIBILITY vs MAGNETIC FIELD X vs. B

These results agrees with the previous, because the maxima of susceptibility represents the coercive field. Which is increasing with coupling strength.



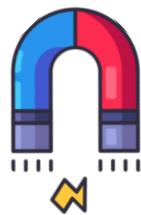
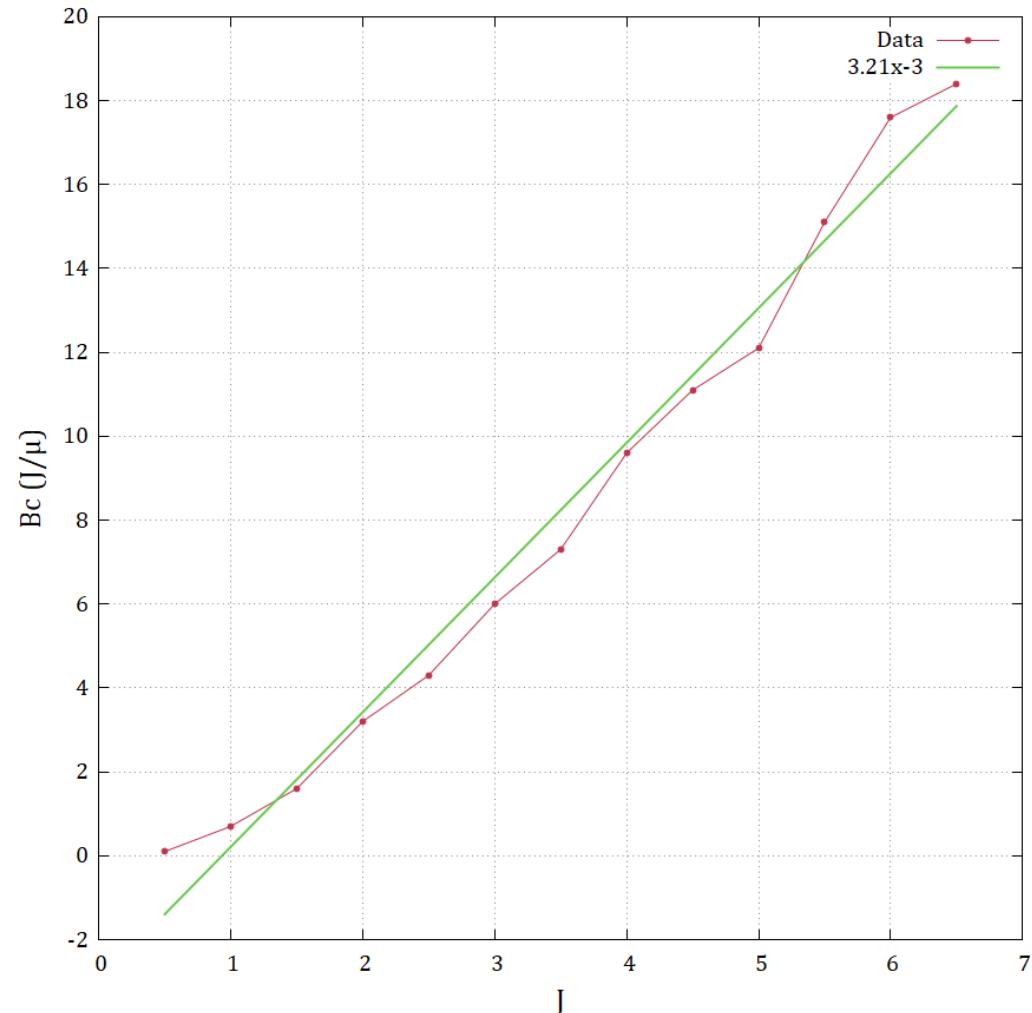
# ● Coupling Constant Analysis

## COERCIVE FIELD vs COUPLING CON. Bc vs. J

Fitting the behavior of coercive field with the coupling strength. Which is found to be linear by this equation:

$$B_c = 3.21x - 3$$

Coercive Field vs Coupling Constant | L=10



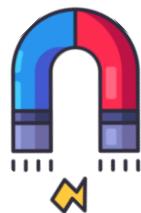
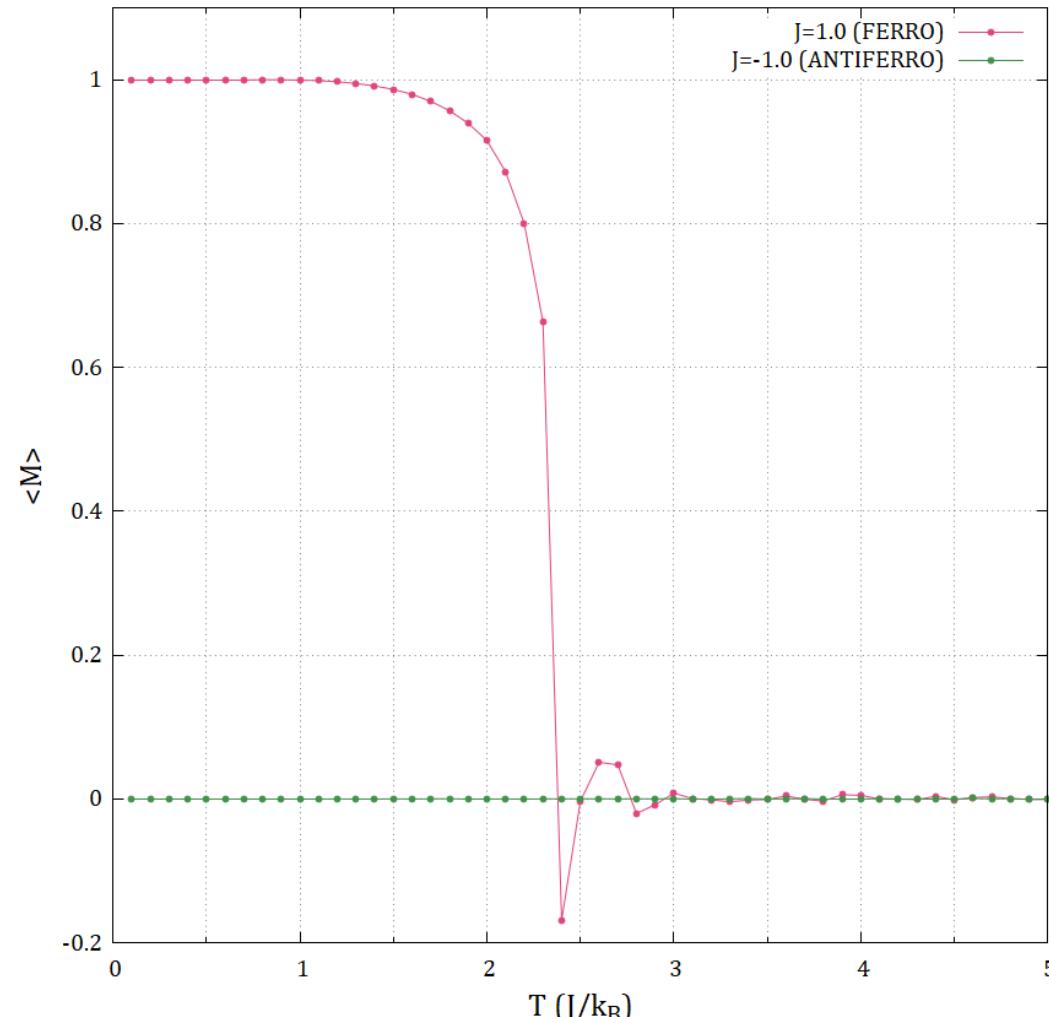
# ● Anti-ferromagnetism

## MAGNETIZATION vs TEMPERATURE $\langle M \rangle$ vs. T

Trying to find the Neel temperature or phase transition of antiferromagnetic material by studying  $M$  vs. T.

Which is NOT useful, because the average of magnetization is zero in both antiferro- and para- regions.

Magnetization vs Temperature | L=50



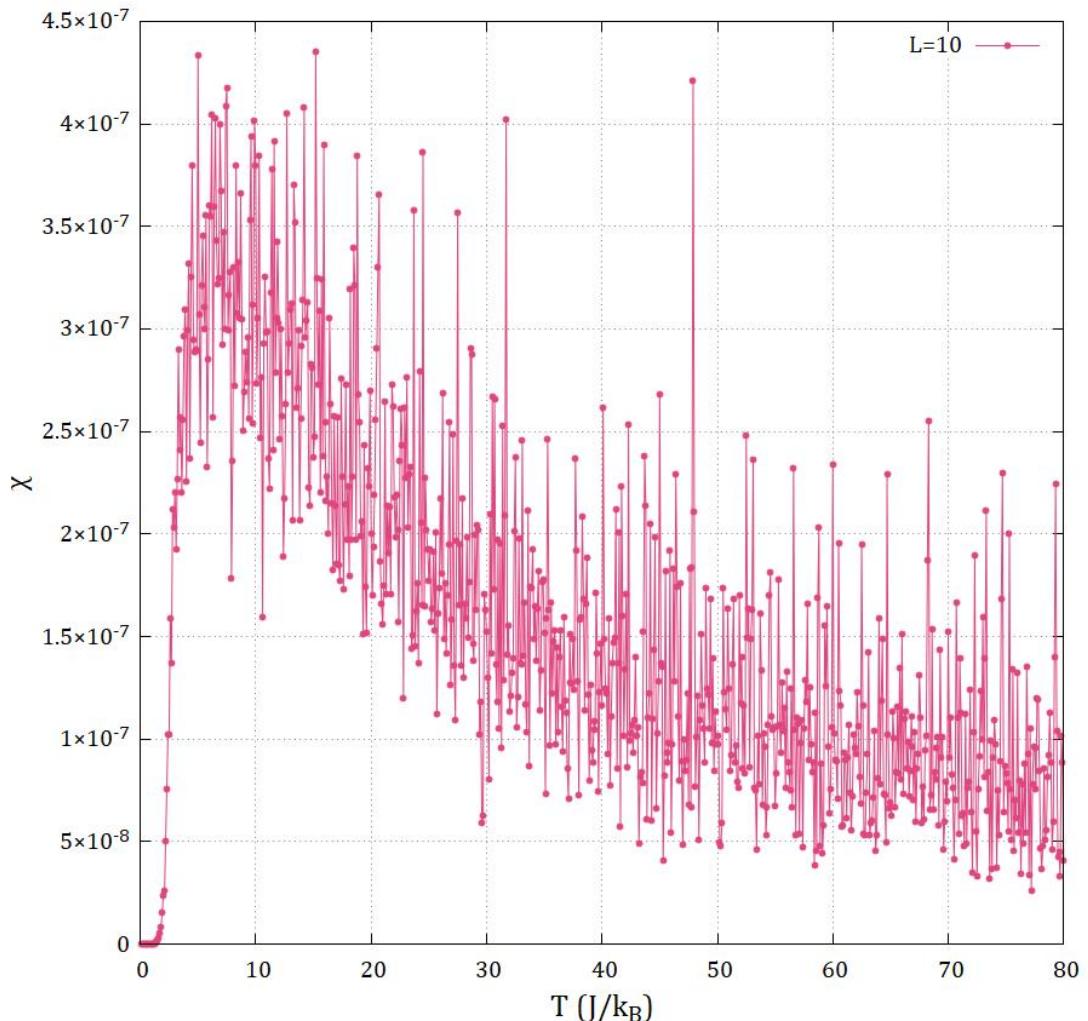
# ● Anti-ferromagnetism

## SUSCEPTIBILITY vs TEMPERATURE $\chi$ vs. T

Finding Néel temperature by studying susceptibility with temperature.

Here, the Néel temperature at the maxima of susceptibility.

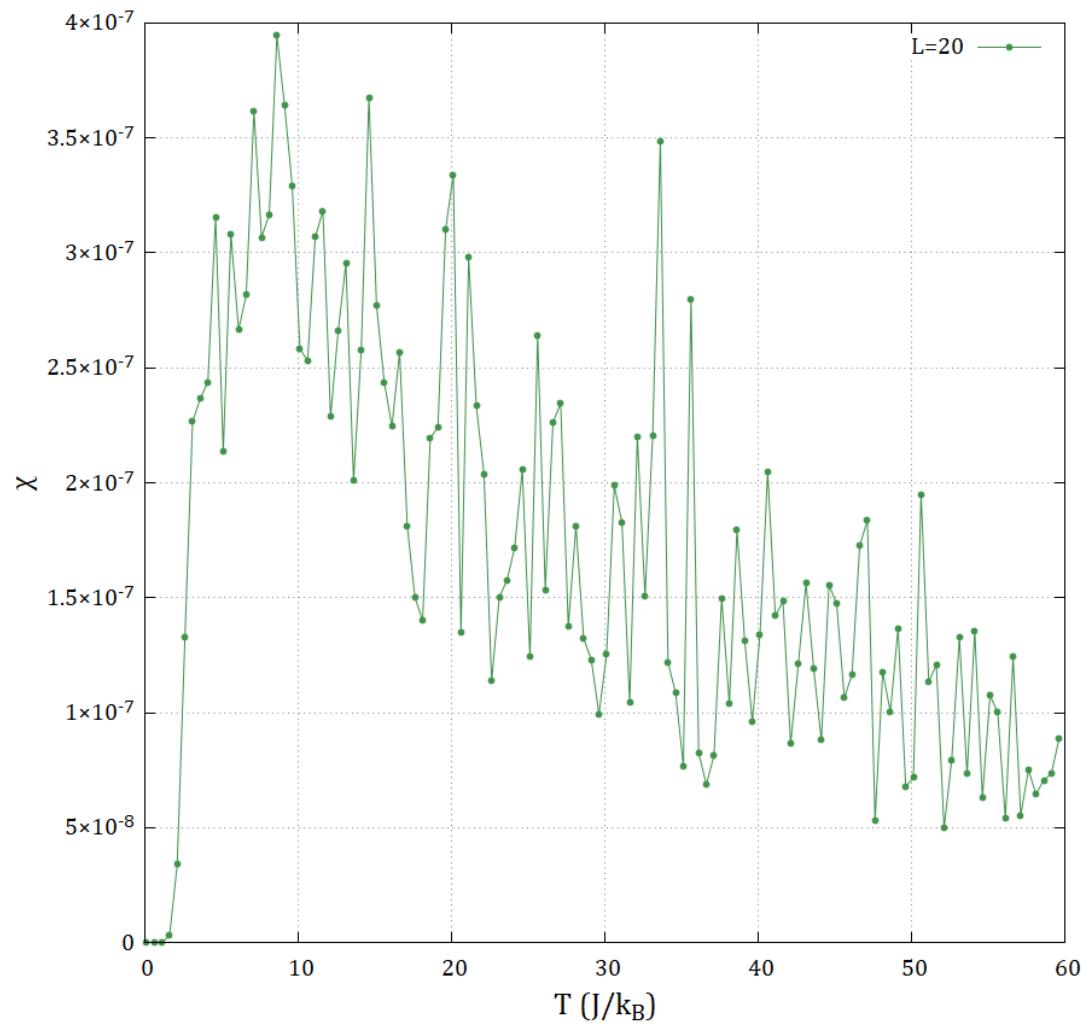
Magnetic Susceptibility vs Temperature



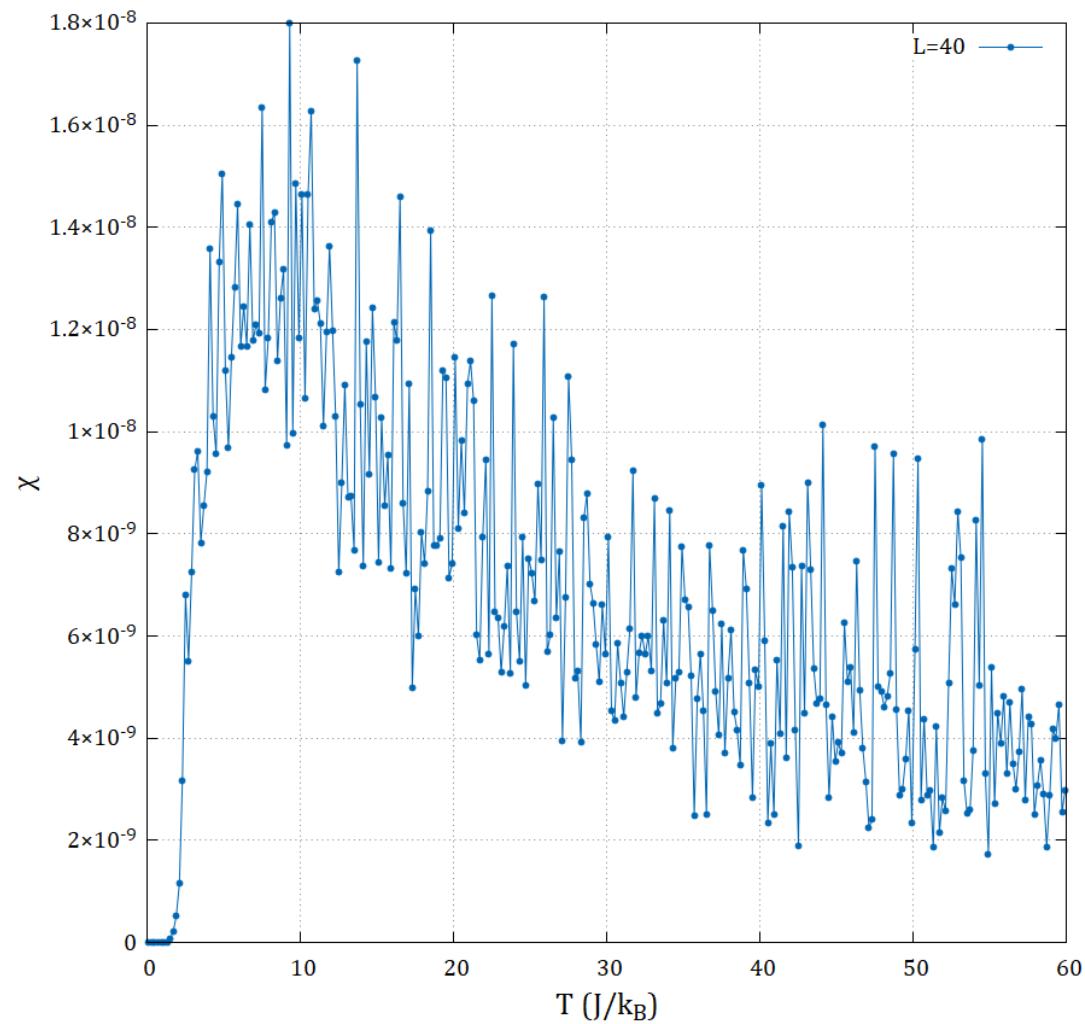


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Magnetic Susceptibility vs Temeprature



Magnetic Susceptibility vs Temeprature



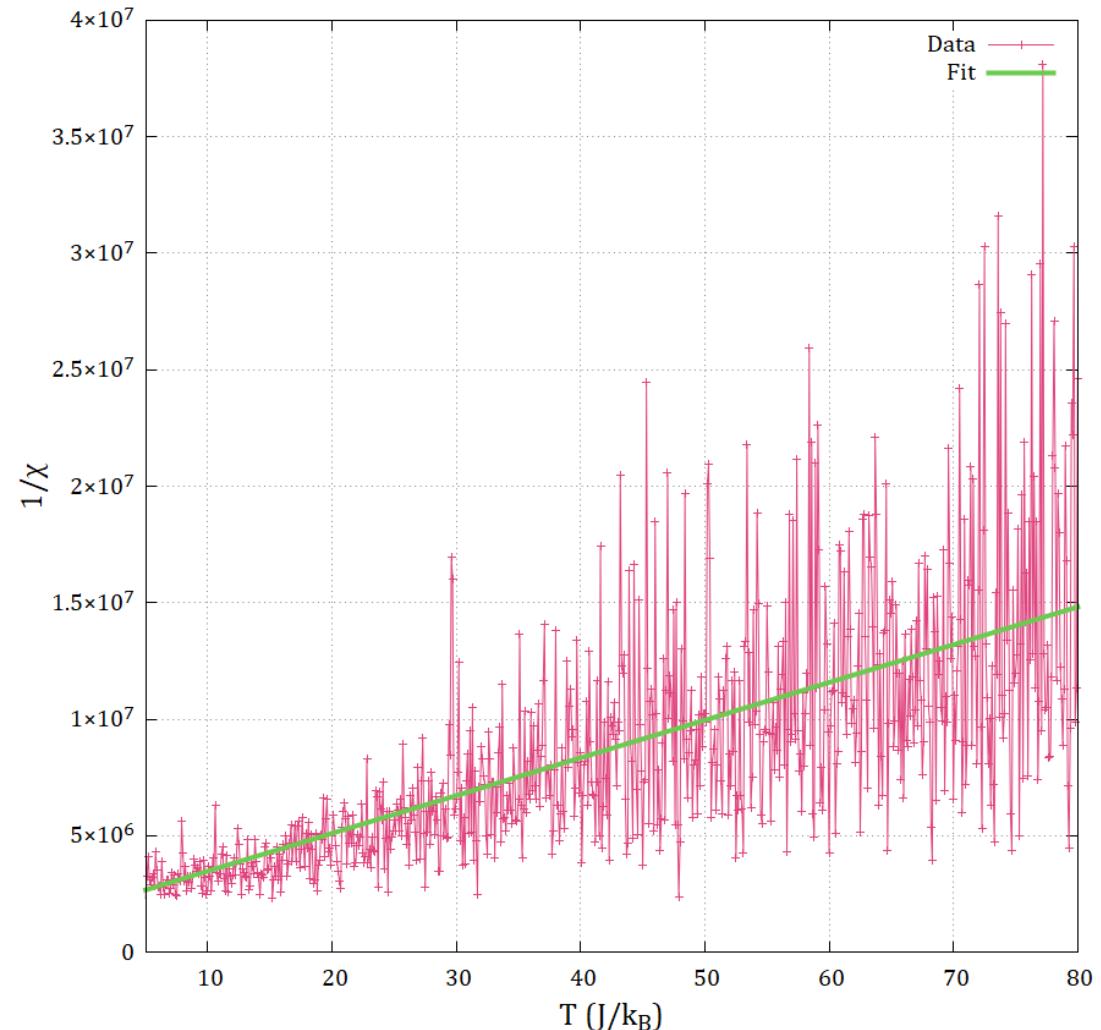
# ● Anti-ferromagnetism

## FINDING NÉEL TEMPERATURE

By fitting  $1/\chi$  vs.  $T$  with a linear equation, due to Curie-Weiss law.

Note that Curie-Weiss law is derived from mean field, so this is just an estimate.

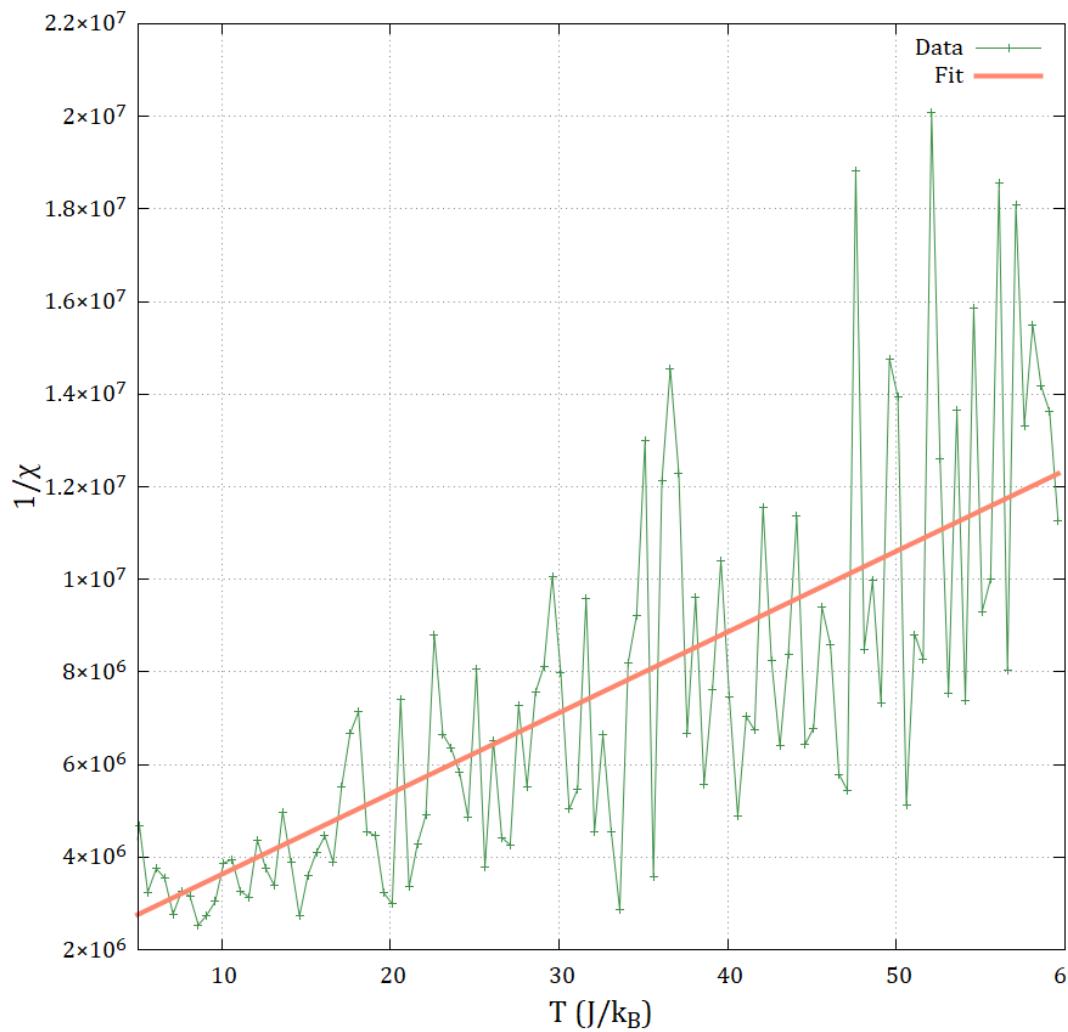
Finding Néel Temperature |  $L=10$ ,  $T_n = 11.475 \text{ J}/\mu$



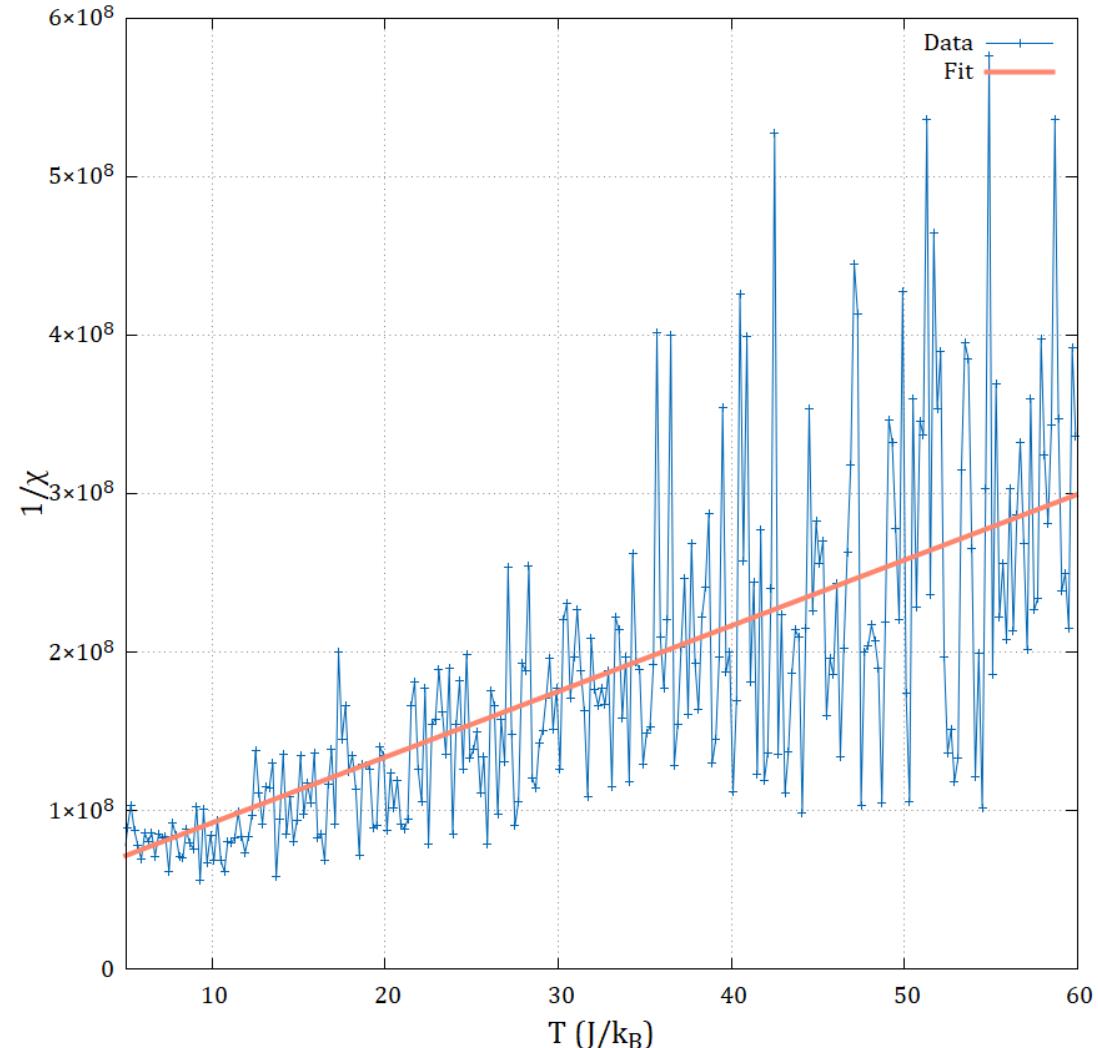


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Finding Néel Temperature |  $L=20$ ,  $T_n = 10.812 \text{ J}/\mu$



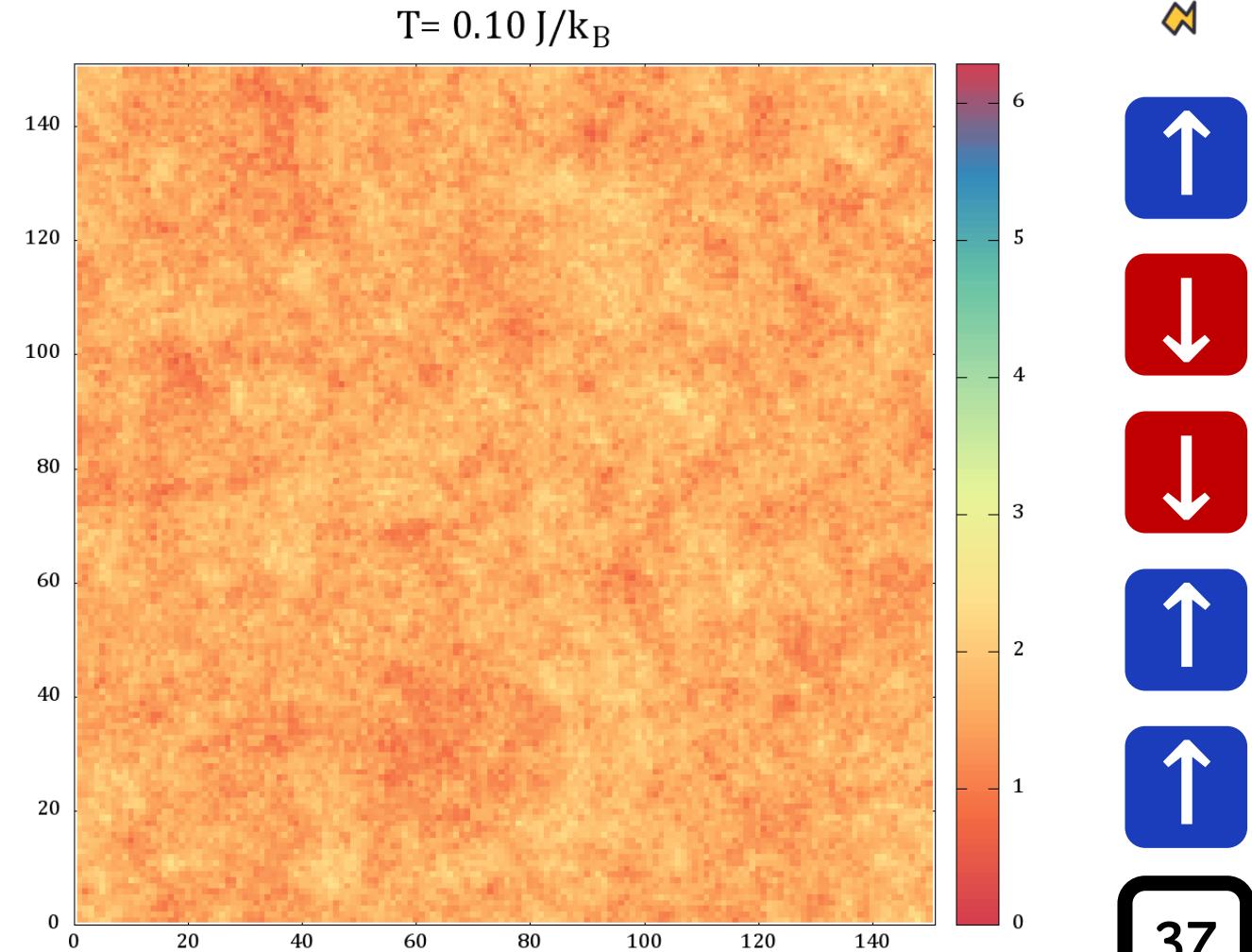
Finding Néel Temperature |  $L=40$ ,  $T_n = 12.247 \text{ J}/\mu$



# ● Arbitrary Spin Direction in 2D

**PHASE TRANSITION**  
Ferro to Para by Increasing Temp.

This animation shows the spins of the system in the transition from ferro- to para- magnetism by increasing temperature.

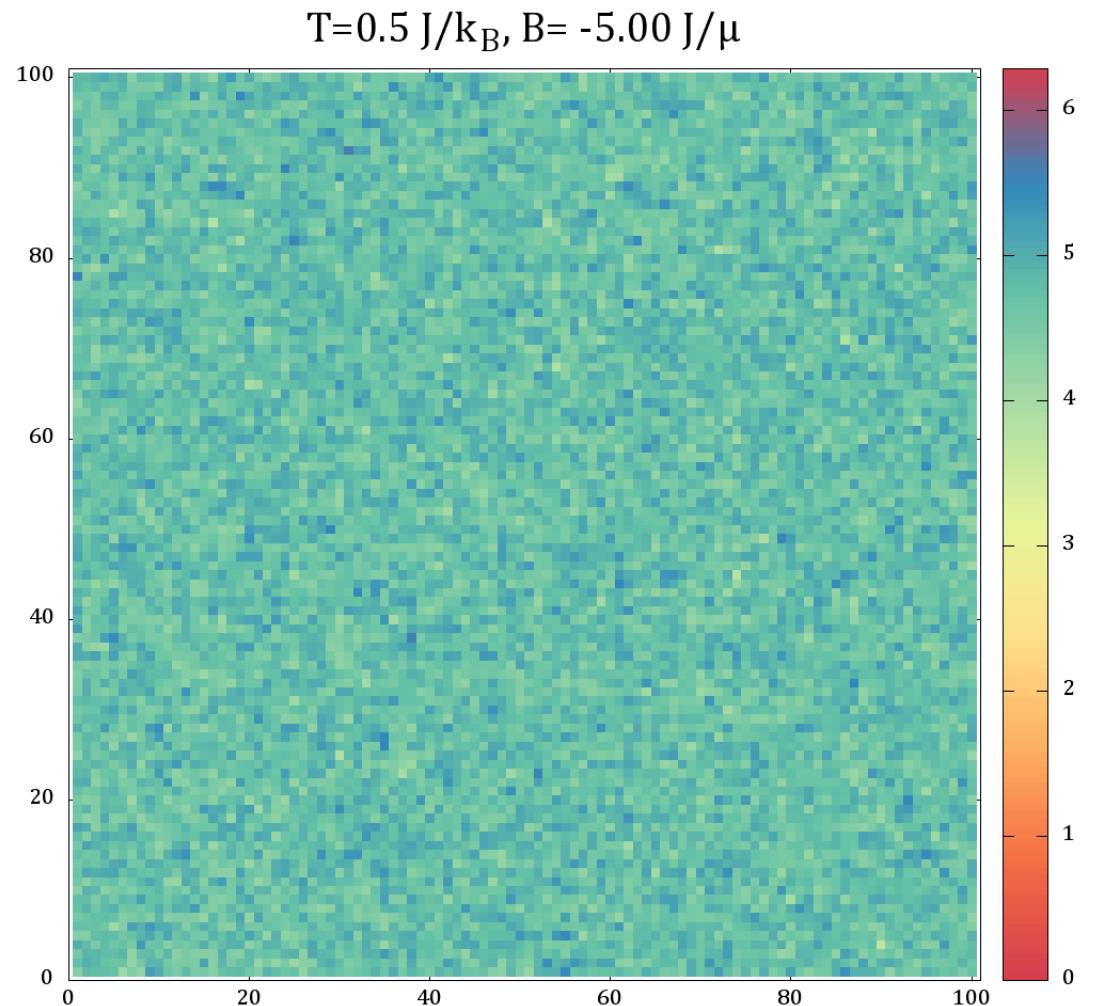


# ● Arbitrary Spin Direction in 2D

## HYSTERESIS LOOP $\langle M \rangle$ vs. B

Visualizing the hysteresis loop by showing the spins as the magnetic field changes.

Try to find the coercive field!



# FUTURE WORK

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- Apply parallelization to run systems larger
- Try other algorithms than Monte Carlo Metropolis, like Wolff algorithm
- Consider other term on Hamiltonian
- Calculate the critical exponents of Ising model
- Study universality, scale invariance of Ising model



# SUMMARY

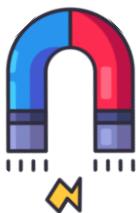
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- 2D and 3D Ising models were simulated
- Effects of system size were studied
- General spin direction was implemented
- The effect of coupling strength is studied
- Anti-ferromagnetism was studied using Ising model



# WORK DISTRIBUTION



Kumail

Asif

Almost Everything

Code – Presentation – Researches  
Making memes – Waiting centuries  
for codes to finish running





**THANK YOU**