

# Project 4 FYS4150

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## Abstract

To do:

Enhet akse Error estimation

Problem: Ulike  $T_C$  for varmekapasitet og X !!!!!

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## 1 Introduction

## 2 Theory

Ising model

Markhow chain - convergance Error Random number ?????

## 2.1 The Ising model

General (kort - viss i forelesningsnotat) simplified version

Bolzman:  $P(E_i) = \frac{e^{-E_i\beta}}{Z_\beta}$ ,  $Z_\beta = \sum_{i=0}^N e^{-E_i\beta}$ . Kommentere temperatur

Energy, magnetic moment, susceptibility, heat capacity, critical temperature:

$$T_C(L) - T_C(L = \infty) = aL^{-1/\nu} \quad (1)$$

Analytical solution

If one has experimental data from two systems with different matrix sizes, L and L', and doing some simple algebra, the following expression emerges for  $T_C(\infty)$ :

$$T_C(\infty) = T_C(L) - aL^{-1/\nu} = T_C(L) - \frac{T_C(L') - T_C(L)}{\frac{1}{L'} - \frac{1}{L}} L^{-1/\nu} \quad (2)$$

## 2.2 Simple example of the Ising model

L=2 case:

$$\begin{aligned} Z &= \sum_i^M e^{-\beta E_i} = e^{-\beta 8J} + e^{-\beta 8J} + e^{\beta 8J} e^{\beta 8J} + 12 \\ &= 2e^{-\beta 8J} + 2e^{\beta 8J} + 12 = 4 \left( \frac{e^{-\beta 8J} + e^{\beta 8J}}{2} \right) + 12 \\ &= 4 \cosh(\beta 8J) + 12 \end{aligned}$$

Energy:

$$\begin{aligned} \langle E \rangle &= k_B T^2 \left( \frac{\partial Z}{\partial T} \right)_{V,N} \\ &= k_B T^2 \frac{\partial}{\partial T} \left[ \ln \left( 4 \cosh \left( \frac{8J}{k_B T} \right) + 12 \right) \right] \\ \frac{\partial \ln Z}{\partial T} &= \frac{\partial Z}{\partial \beta} \frac{\partial \beta}{\partial T} = \frac{\partial \ln Z}{\partial \beta} \left( \frac{-1}{k_B T^2} \right) \\ \langle E \rangle &= - \left( \frac{\partial Z}{\partial \beta} \right)_{V,N} = - \frac{\partial}{\partial \beta} \ln [4 \cosh(8J\beta) + 12] \\ &= \frac{-1}{4 \cosh(8J\beta) + 12} 4 \sinh(8J\beta) 8J\beta \\ &= \frac{-8J \sinh(8J\beta)}{3 \cosh(8J\beta) + 4} \end{aligned}$$

Following the same method, we found that:

$$\langle |M| \rangle = \frac{1}{Z} \sum_i^M M_i e^{\beta E_i} = \frac{(8J)^2 \cosh(8J\beta)}{\cosh(8J\beta) + 3}$$

$$\langle M \rangle = 0$$

$$\langle E^2 \rangle = \frac{8(e^{8J\beta} + 1)}{\cosh(8J\beta) + 3}$$

$$\langle M^2 \rangle = \frac{1}{Z} \left( \sum_i^M M_i^2 e^{\beta E_i} \right) = \frac{2(e^{8J\beta} + 2)}{\cosh(8J\beta) + 3}$$

We can use these to calculate the rest:

$$C_V = k\beta^2 (\langle E^2 \rangle - \langle E \rangle^2)$$

$$\chi = \beta (\langle M^2 \rangle - \langle M \rangle^2)$$

Table 2.1: text

No spin up	Deg	Energy	Magnetization
0	1	-8J	-4
1	4	0	-2
2	4	0	0
2	2	8J	0
3	4	0	2
4	1	-8J	4

## 2.3 Introduction to statistics

$$P(a \leq X \leq b) = \int_b^a p(x) dx \quad (3)$$

$$\langle x \rangle = \sum_i x_i p_i \quad (4)$$

$$\langle x^n \rangle = \sum_i x_i^n p_i \quad (5)$$

$$\langle x \rangle = \int x p(x) dx \quad (6)$$

## 3 Method

Metropolis (T,A,...) Stokastisk matrise - konvergens - Markhov chain. Equilibrium- hva skjer med Z?

Hvilken random number engine ???

OBS: Bruker forventning av abs(M) i susceptibilitet.

VILDE:

### 3.1 Monte Carlo cycles

In Monte Carlo methods, the goal is to

### 3.2 Metropolis algorithm

### 3.3 Random number generator

### 3.4 Parallelizing

Speedup

Metropolis (T,A,...) Stochastic matrix - convergences (forhold eigenvalue).

Hvilken random number engine

MPI:

- Develop codes locally, run with some few processes and test your codes. Do benchmarking, timing and so forth on local nodes, for example your laptop or PC. - When you are convinced that your codes run correctly, you can start your production runs on available supercomputers.

MPI functions:

## 4 Result

### 4.1 The L=2 case

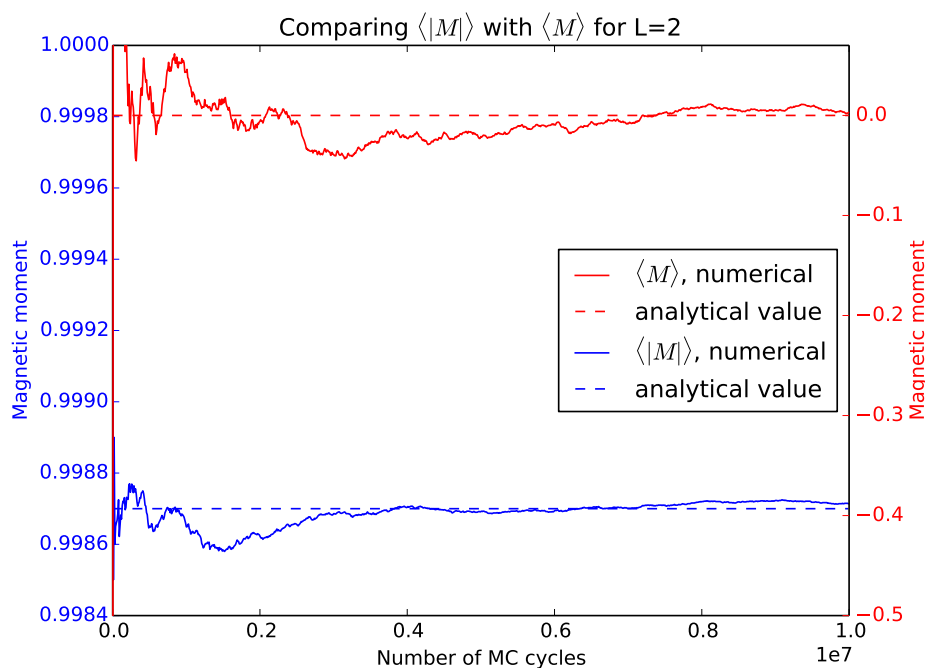


Figure 4.1

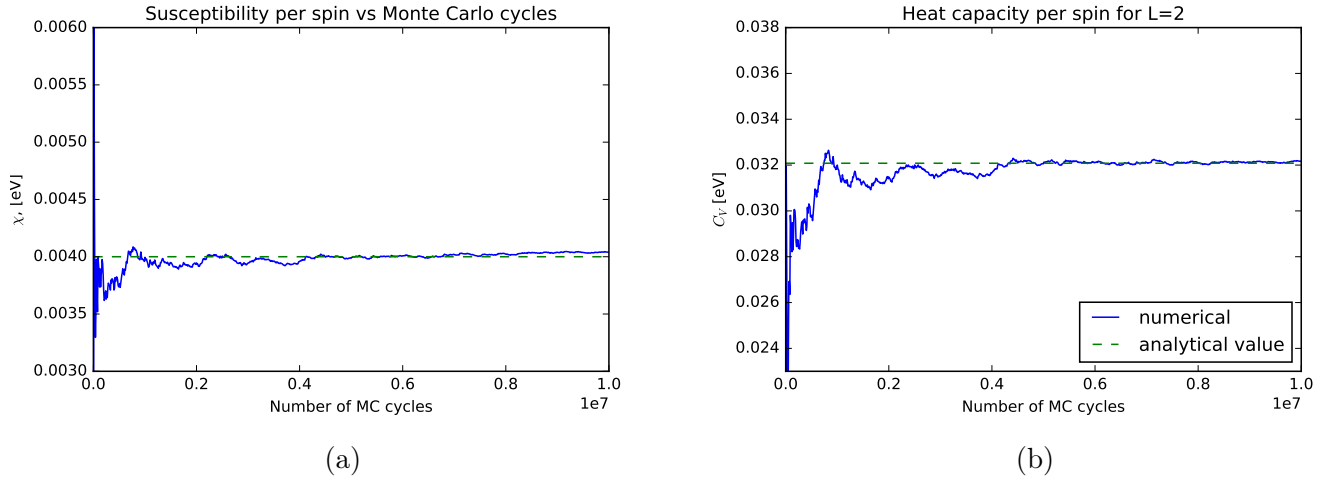


Figure 4.2:  $\theta/2\theta$  scan around the (0002) peak and (0004) peak of ZnO and GaN.

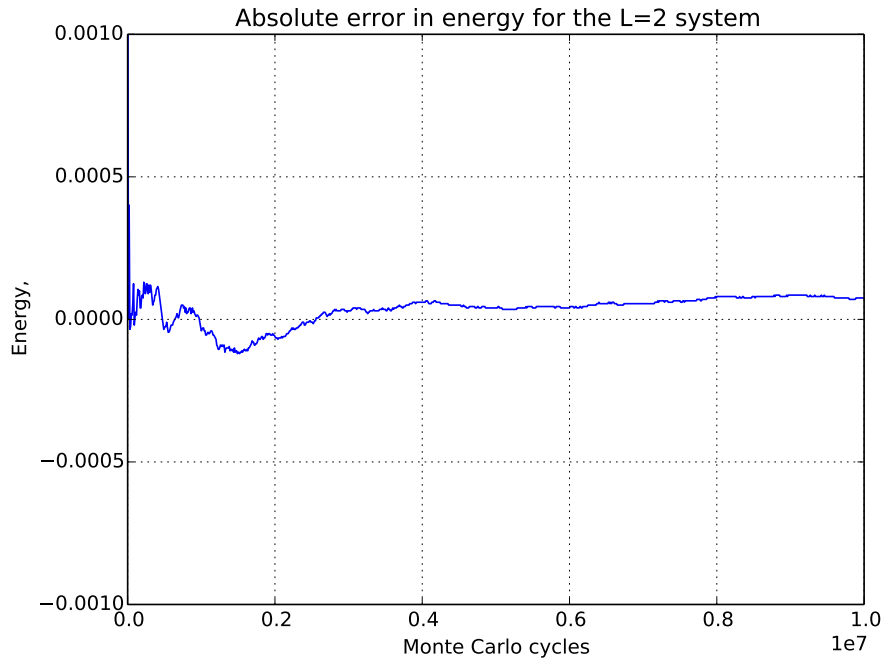


Figure 4.3

OBS! Need an number of MC cycles necessary!

All calculations in this subsection are at  $T = 1.0$  K.

## 4.2 The L=20 system

HMM: Should define an area that is enough for equilibrium!

OBS: Need the number of MC cycles to reach equilibrium!

OBS: Need equilibration time! ( $5 \times 10^5$ ?)

OBS: Comment accepted configs T dependency

Table 4.1: This table compares the analytical values for  $L=2$  with the numerical ones after  $10^6$  Monte Carlo cycles. The values are in units per spin.

	Numerical:	Analytical:
$\langle E \rangle$	-1.9958	-1.9960
$\langle E^2 \rangle$	15.9664	15.9679
$\langle M \rangle$	0.0451	0
$\langle M^2 \rangle$	3.9930	3.9933
$\langle  M  \rangle$	0.9986	0.9987
$\chi$	3.9849	3.9933
$C_V$	0.0335	0.0321

#### 4.2.1 Initial ordering of the system

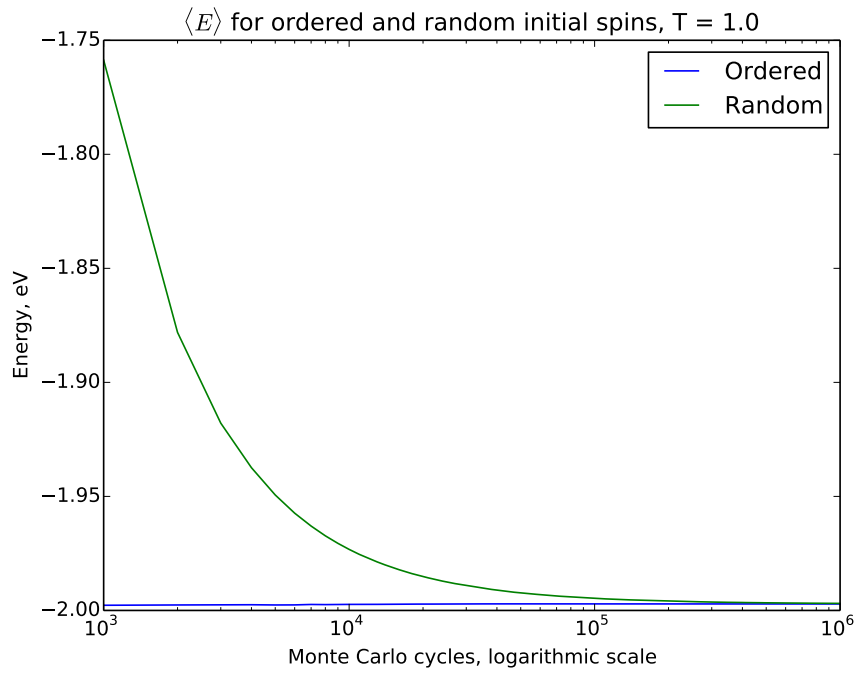


Figure 4.4

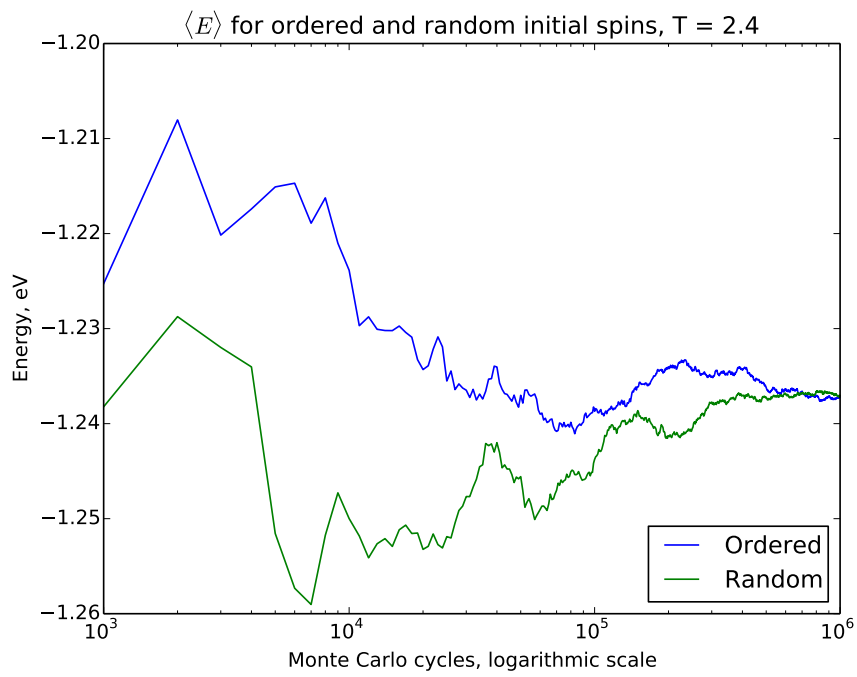


Figure 4.5

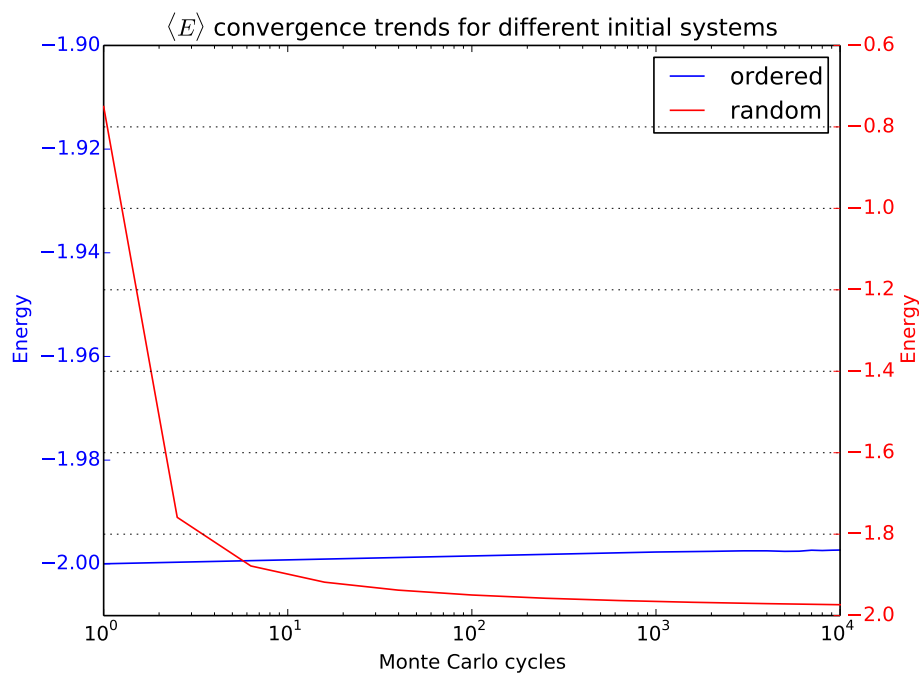


Figure 4.6: OBS: Different y-axis!

### 4.2.2 Equilibrium time for the random L=20 system

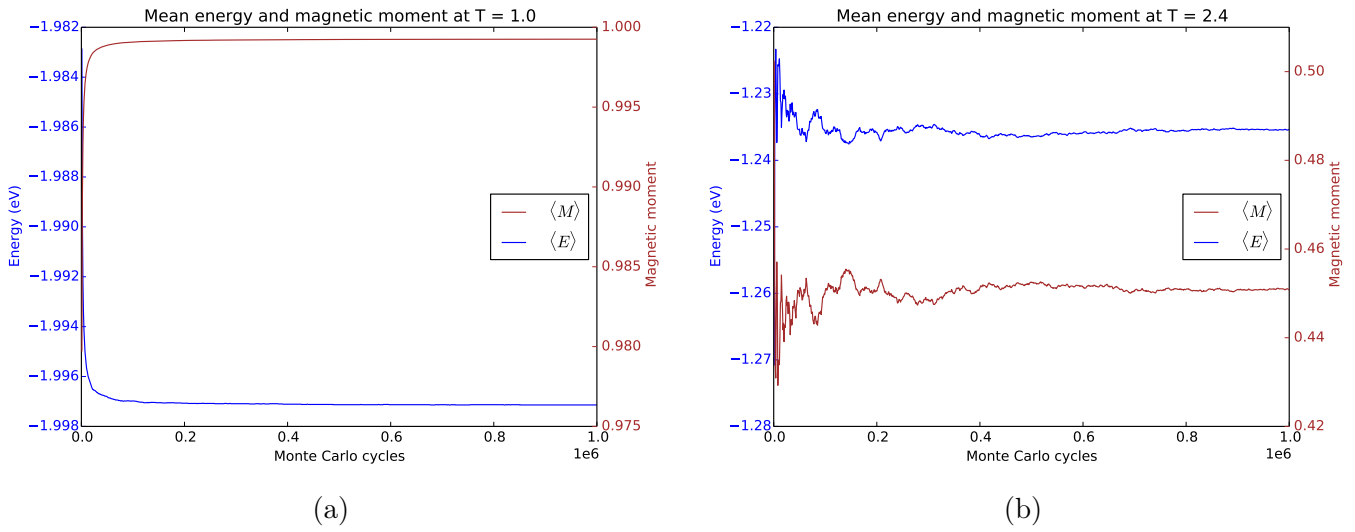


Figure 4.7

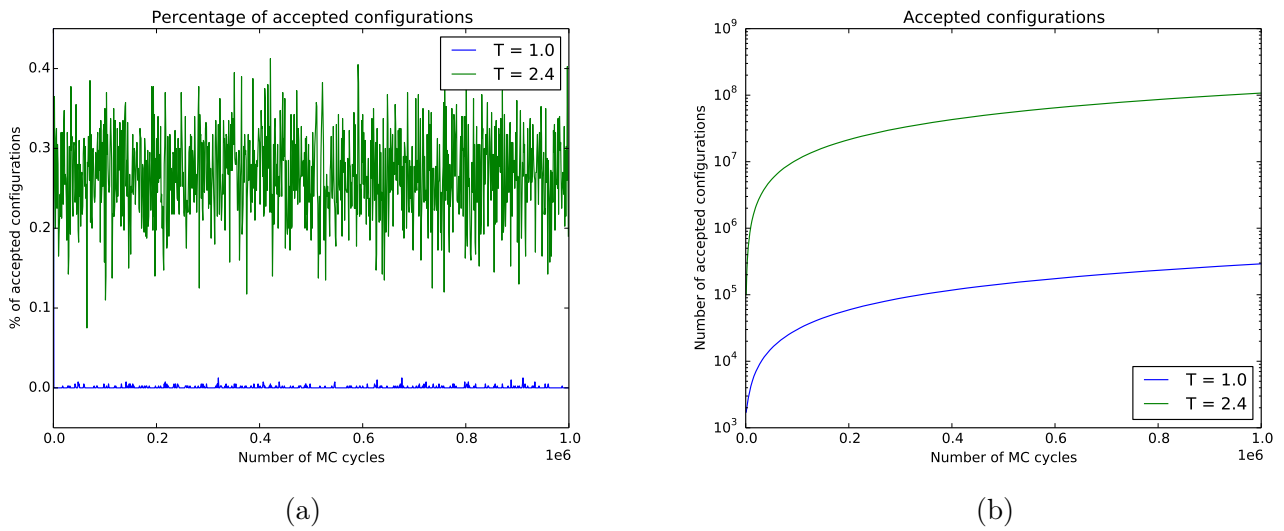


Figure 4.8

### 4.2.3 Probability distribution for the L=20 system

OBS: Compare result with computed variance!

OBS: Discuss behavior (In Discussion - maybe just merge result and discussion?)

Computed variance (from same dataset?):

$$\sigma_E^2 = \langle E^2 \rangle - \langle E \rangle^2$$

T = 1.0 K:

$$\sigma_E^2 = 1595.45 - (-1.997)^2 = 1591.46$$

T = 2.4 K:



$$\sigma_E^2 = 620.734 - (-1.23759)^2 = 619.20$$

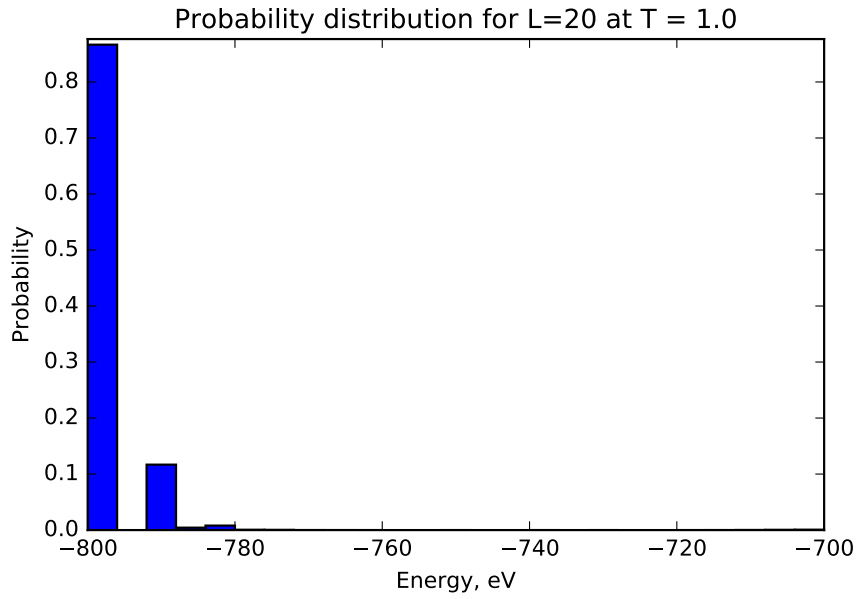


Figure 4.9

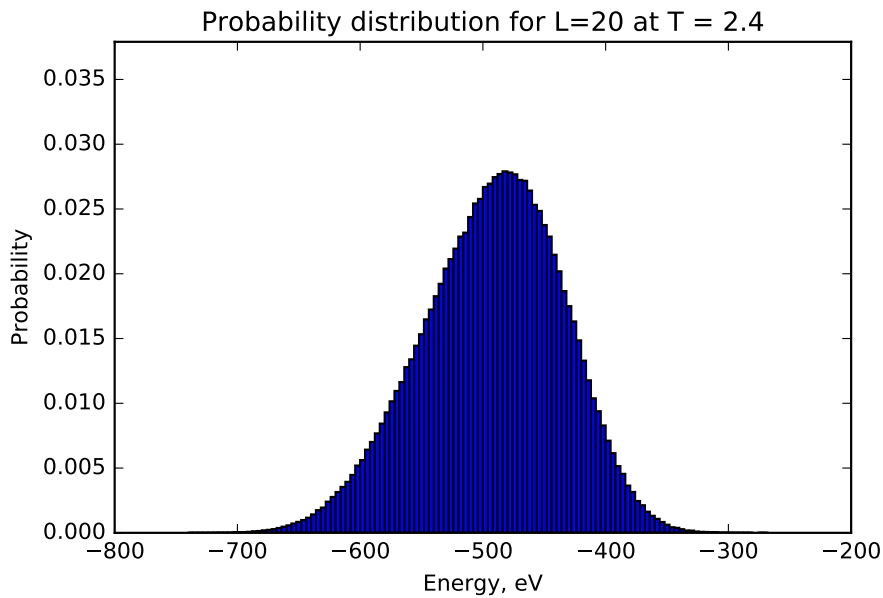


Figure 4.10

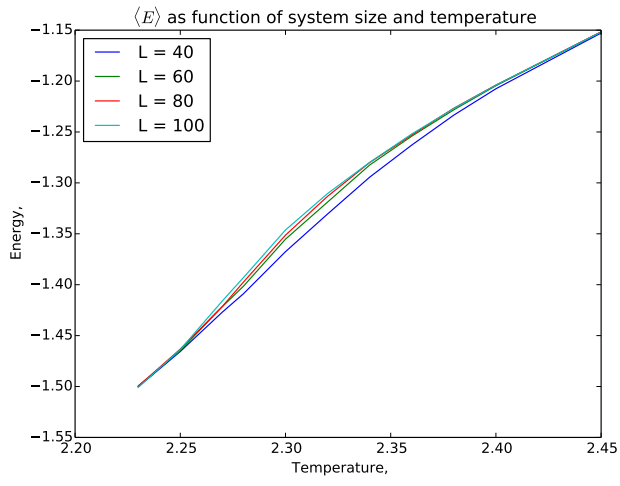
### 4.3 Phase transition and Critical temperature

OBS: Plot of E, M, Cv, X as functions of T (put L as legend and plot together)

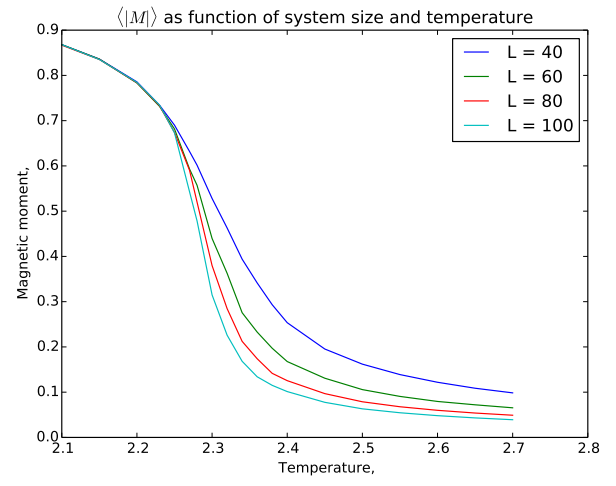
OBS: Indication of phase transition? (Peak - at least for Cv and X)

OBS: Use Equation 1 to extract  $T_C$ .

Timing parallellising



(a)



(b)

Figure 4.11

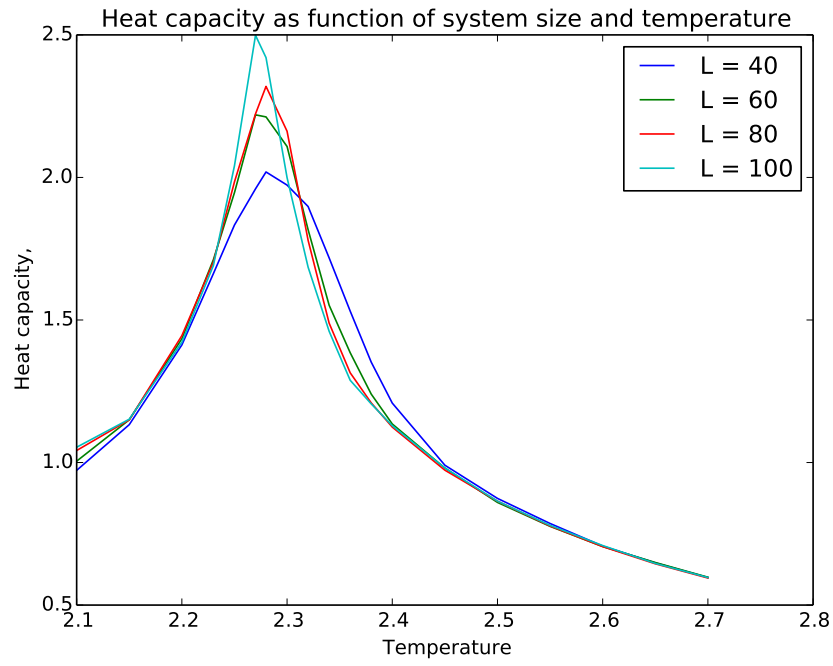


Figure 4.12

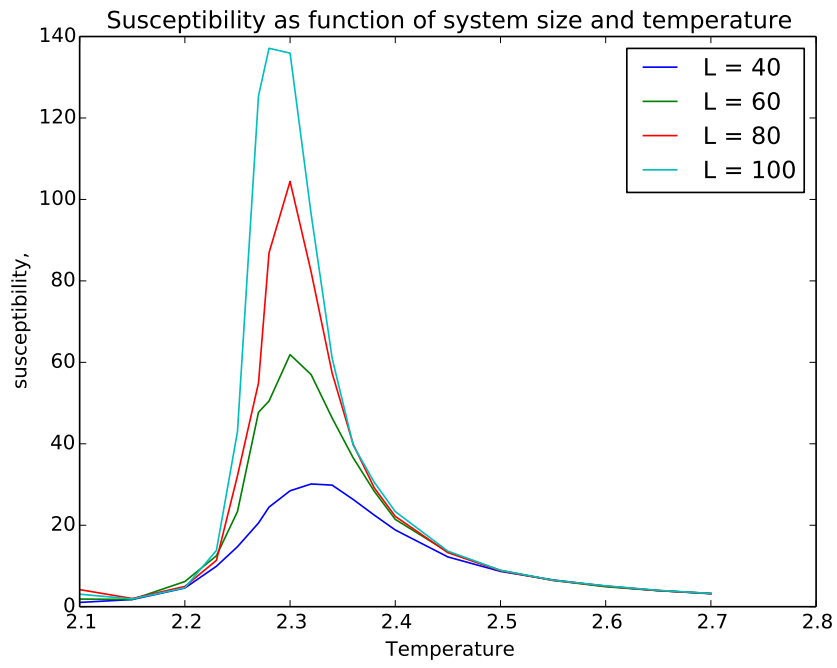


Figure 4.13

Table 4.2: text

L	$T_C$
40	2.28
60	2.27
80	2.28
100	2.27

## 5 Discussion

## 6 Conclusion

## References

## Appendix

Table 6.1: Table of all the possible microstates for the L=2 system

State	Spinn	Energi	Magnetization
0	↓↓↓↓	-8J	-4
1	↓↓↓↑	0	-2
2	↓↓↑↓	0	-2
3	↓↑↓↓	0	-2
4	↑↓↓↓	0	-2
5	↓↓↑↑	0	0
6	↓↑↓↑	0	0
7	↓↑↑↓	8J	0
8	↑↓↓↑	8J	0
9	↑↓↑↓	0	0
10	↑↑↓↓	0	0
11	↓↑↑↑	0	2
12	↑↓↑↑	0	2
13	↑↑↓↑	0	2
14	↑↑↑↓	0	2
15	↑↑↑↑	-8J	4