# FYS3150 Computational Physics - Project 4

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This is an abstract

#### INTRODUCTION

### THEORY, ALGORITHMS AND METHODS

### The Ising Model

In its simplest case, a paramagnet is described as a lattice of noninteracting dipole moments, each in a state up or down. Where the energy of the system is proportional to the sum of the spins, up or down of each noninteracting constituent.

The Ising model is a natural extension to this, by adding local interaction between directly neighboring spins (See fig. 1), such that the energy of the system is instead proportional to the sum of the interactions of all coupled spins, which gives a much more accurate description of the system compared to the simple case of an ideal paramagnet.

Or more precisely, the energy is given by Eqn. 1, where  $s_i \in \{-1, 1\}$  and J is a coupling constant.

$$E = -J \sum_{\langle kl \rangle} s_k s_l \tag{1}$$

In this summation, the notation < kl > means that we take the sum over each direct interaction. Consider again Fig.1. The contribution,  $\epsilon_i$ , to the total energy due the interactions at spin-site i is the sum of its interactions,  $\epsilon_i = s_i(s_\uparrow + s_\downarrow + s_\leftarrow + s_\rightarrow)$  where the arrows denote the spin-site directly neighboring site i in the direction of the arrow. Now wish to compute the energy contribution due to the interactions at the spin-site left of site i. In this case, the interaction between it, and spin-site i has already been computed, and must not be counted again. So in that sense,  $\sum_{< kl>} s_k s_l$  should be thought of as a sum over interactions between spins, and not so much the interactions between neighboring spins at each spin-site, which is only strictly true when considering a single spin-site.

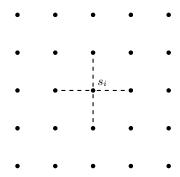


FIG. 1: Section of a 2D lattice, where each spin-site is represented by a dot. In the Ising model, spin-site i will only interact with its directly neighbouring spin-sites, connected by dotted lines in this diagram

Further, in this project the lattice will be treated as pseudo-continuous where any spin-sites located at an edge, will also interact with the spin-site on the opposing edge, illustrated in Fig. 2, which strictly speaking constitutes having periodic boundary conditions. If instead we had fixed boundary conditions, there would simply be no such across-lattice interactions, and spin-sites located at the edges would then only interact with 3 other spin-sites (2 in the case of corner sites) in the 2D case.

Much simpler, the net magnetization,  $\mathcal{M}$ , of the system is taken as the sum over all spins

$$\mathcal{M} = \sum_i s_i$$

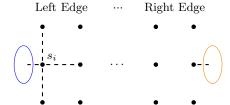


FIG. 2: Spin-site i, located at the left edge of the lattice interacting with its direct neighbors, as well as the spin site on the opposite edge of the lattice

## Boltzmann Statistics

From this model we can derive many thermodynamic quantities by the use of Boltzmann statistics, where we have the probability of the system being in some specific macro-state<sup>1</sup> at temperature<sup>2</sup>

$$\mathcal{P}(E_s) = \frac{1}{Z}e^{-\beta E_s} \tag{2}$$

With  $\beta \equiv \frac{1}{k_BT}$ , the thermodynamic beta and Z, the partition function, acting as a normalization factor given by<sup>3</sup>

$$Z = \sum_{s} e^{-\beta E_s} \tag{3}$$

From this, the expectation value of some quantity X, with a set of known macrostates  $X_s$  can be computed by

$$\langle X \rangle = \sum_{s} X_{s} \mathcal{P}(E_{s}) = \frac{1}{Z} \sum_{s} X_{s} e^{-\beta E_{s}}$$
 (4)

Using this, we can compute the specific heat capacity,  $C_V$  by computing the expectation values of  $E, E^2$  [1], related by the following expression

$$C_V = \frac{\langle E^2 \rangle - \langle E \rangle^2}{k_B T^2} \tag{5}$$

Where  $\langle X^2 \rangle - \langle X \rangle^2$  is recognized as the variance of a set of randomly distributed quantities,  $\sigma_X^2$ .

In a similar fashion, the magnetic susceptibility,  $\chi$ , is calculated from  $\sigma^2_{\mathcal{M}}$  [1]

$$\chi = \frac{\sigma_{\mathcal{M}}^2}{k_B T} \tag{6}$$

For more details on the Ising model, or Boltzmann statistics refer to Schroeder [2, Chapters 6, 8.2], Hjorth-Jensen [1], or similar introductory texts on the topic.

Analytic solution of 2x2 Lattice

Consider now a 2x2 lattice, each with spin  $\pm 1$ . The energy of the system for a particular micro-state is given by Eqn. 1, so for a  $2 \times 2$  lattice we have

$$E = -J \sum_{\langle kl \rangle} s_{kl} = -J(2s_1s_2 + 2s_1s_3 + 2s_2s_4 + 2s_3s_4)$$
(7)

So in the micro-state where all the spins are aligned in parallel, we have  $E=\pm J$ 



FIG. 3: A  $2 \times 2$  lattice of spin-sites

#### The Metropolis Algorithm

### Metropolis Algorithm

#### RESULTS AND DISCUSSIONS

#### CONCLUSIONS

- [1] M. Hjorth-Jensen, "Computational physics lectures: Statistical physics and the ising model," (2017).
- [2] D. V. Schroeder, An Introduction to Thermal Physics, 1st ed. (Pearson, 1999).

Macroscopic states being characterized by their energy, meaning i could just as well have written "... the probability of the system having some speciffic energy"

 $<sup>^2</sup>$  Contained within  $\beta$  in this notation

<sup>&</sup>lt;sup>3</sup> Strictly speaking, this is the partition function for a system with discrete macro-states. In the continuous case, simply replace sums with integrals.