

Umeå Universitet  
Department of Physics  
Monte Carlo methods  
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**Examination, Monte Carlo methods, 7.5hp, 2010–06–01, at 9.00–15.00, Östra paviljongen.**

Allowed aids: Calculator, Beta, Physics Handbook.

Hand in each problem on a separate page.

The calculations and the reasoning should be easy to follow.

*Good luck!*

### 1 Basic statistics

- a) Consider independent, random variables  $x_i$  with average  $\mu$  and variance  $\sigma^2$ . The average of  $N$  such variables is

$$m = \frac{1}{N} \sum_{i=1}^N x_i.$$

What is  $\sigma_m^2$ , the variance of  $m$ ? (1p)

- b) Derive this result. (2p)

- c) Specialize to the case where the  $x_i$  are from a uniform distribution between  $-1$  and  $1$  and  $N = 100$ . What is the distribution of  $m$ ? (2p)

### 2 Theory behind Markov chains (3p)

A Markov chain may be described as a transition matrix  $p_{ij}$ . Describe the three conditions that have to be fulfilled by this matrix and motivate why they are necessary. *Hint: The first has to be true for all  $p_{ij}$ , the second is for  $p_{ii}$ , and the last concerns  $\sum_j p_{ij}$ .*

### 3 1D Ising model

Show that the 1D Ising model is disordered for all  $T > 0$ . (4p)

### 4 Scaling analysis

One way to analyze experimental data (or simulations at big lattices) is to plot  $m/|t|^a$  versus  $h/|t|^c$ . Start from  $m \sim \partial f / \partial h$  and

$$f(t, h) = b^{-d} f(tb^{y_t}, hb^{y_h}),$$

and express  $a$  and  $c$  in terms of  $d$ ,  $y_t$ , and  $y_h$ . (4p)

### 5 Expectation values

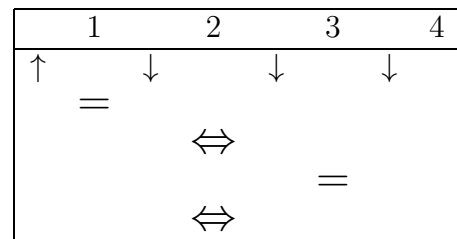
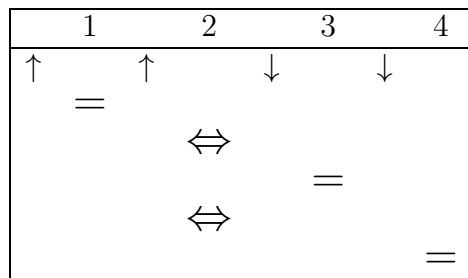
For small lattices it is possible to use three different methods to calculate the properties of the Ising model:

- (1) Through a complete enumeration of all the possible states.
  - (2) By generating a set of randomly produced configurations.
  - (3) Through a Monte Carlo simulation.
- a) Describe the formulas that should be used to calculate expectation values in methods (1), (2), and (3). Assume that we have access to  $A_\nu$  and the energy  $E_\nu$  for each generated configuration and want to calculate  $\langle A \rangle$ . (3p)
  - b) Why could it sometimes be motivated to study a system through a complete enumeration? (1p)
  - c) Consider a complete enumeration of a  $L \times L$  Ising model. What is the maximum size  $L$  that would be possible to study in 24 hours on a single 3GHz-processor. Base your answer on some reasonable assumptions. (2p)

### 6 Quantum Monte Carlo

The figures below show representations of two terms in the space of spin states and operators for the spin-1/2 Ising model with four spins. The symbol “ $\Leftrightarrow$ ” symbolizes an off-diagonal operator whereas “ $=$ ” is a diagonal operator.

- a) Which of these states represents a non-vanishing term? Why? (2p)
- b) What is the order of the expansion (denoted by  $n$ ) of the non-vanishing term? (1p)



### 7 Master-equation solution of a two state system

A simple system has two states 0 and 1 with energies  $E_0$  and  $E_1$  respectively. Transitions between the two states take place at rates  $P(0 \rightarrow 1) = R_0 \exp[-\beta(E_1 - E_0)]$  ( $\beta$  is the inverse temperature) and  $P(1 \rightarrow 0) = R_0$ . Let  $w_0(t)$  and  $w_1(t)$  be the probabilities of the system being in state 0 or 1 as a function of time  $t$  with the initial conditions  $w_0(0) = 0$  and  $w_1(0) = 1$ .

a) Express  $dw_0/dt$  in terms of  $\beta$ ,  $R_0$ ,  $E_0$  and  $E_1$ . (3p)

b) Solve this equation and show that the system obeys the Boltzmann distribution in the limit  $t \rightarrow \infty$ . (3p)

### 8 Conserved-order-parameter Ising model

The conserved-order-parameter Ising model is defined just like the regular Ising model but with the extra condition that the magnetization is fixed  $M$  (i.e. a control parameter of the model). The traditional way of simulating the conserved-order-parameter Ising model is by the Kawasaki algorithm defined as follows on a lattice with  $N$  spins:

1. Start with any configuration of  $(N+M)/2$  up-spins and  $(N-M)/2$  down-spins.
2. Chose two sites  $i$  and  $j$  at random.
3. If  $\nu$  is the current spin-configuration, let  $\mu$  be the spin configuration where  $s_i$  (the value of the spin at site  $i$ ) has the value that  $s_j$  does in  $\nu$  and  $s_j$  of has the value that  $s_i$  has in  $\nu$ .
4. Let  $\Delta E = H(\mu) - H(\nu)$ , where  $H$  is the Ising Hamiltonian.
5. If  $\Delta E < 0$ , or with a probability  $\exp(-\beta \Delta E)$  ( $\beta$  is the inverse temperature), swap the spin-values of sites  $i$  and  $j$ .
6. Go to step 2.

Obviously the magnetization is constantly  $M$ . Our questions are:

a) Define *ergodicity*. (1p)

b) Why does the Kawasaki algorithm sample the configurations of the conserved-order-parameter Ising model ergodically? (1p)

c) Define *detailed balance*. (1p)

d) Why does the Kawasaki algorithm fulfill detailed balance? (2p)

- e) Obviously  $s_i = s_j$  (in step 2) implies that  $\nu = \mu$ . The simulation might be faster if one chose  $i$  and  $j$  randomly only among all *neighboring* pairs of sites with *different* spin values. This algorithm would however not sample the Boltzmann distribution. Why? Illustrate with a concrete example (with explicit configurations) in a system of just a few spins. (4p)