

**Handing out:** 26.06.2023  
**Submission:** 07.07.2023 8 pm

Prof. H. Jelger Risselada

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### Exercise 0: Comprehension questions

0 Points

- 1) What is the difference between molecular dynamics (MD) simulation and Monte Carlo (MC) simulation for molecular systems? When is each method suitable?
- 2) What are the fundamental properties of a Markov process?

### Exercise 1: Monte Carlo Simulation of a Single Spin

10 Points

Simulate a single spin  $\sigma = \pm 1$  using the Metropolis algorithm with the energy

$$\mathcal{H} = -\sigma H$$

in an external magnetic field  $H$ . In the Metropolis algorithm, offer spin flips  $\sigma \rightarrow -\sigma$ . Numerically calculate the magnetization  $m$  at  $k_B T = 1$ . In other words, perform Monte Carlo simulations for at least  $10^4$  values of  $H \in [-5, 5]$ , each with  $10^5$  steps, and compare your numerical results with the analytical result

$$m = \tanh(\beta H).$$

### Exercise 2: Two-Dimensional Ising Model

30 Points

Simulate the two-dimensional Ising model without a magnetic field using the Metropolis algorithm, with the energy given by

$$\mathcal{H} = - \sum_{i,j \text{ n.n.}} \sigma_i \sigma_j,$$

where the sum is taken over nearest neighbors (n.n.). Use a square lattice of size  $100 \times 100$  with periodic boundary conditions. (If there are issues with computation time, the lattice can be slightly reduced.)

Offer spin flips of randomly selected spins in the Metropolis algorithm. Choose randomly oriented spins or completely ordered spins as initial conditions. After a sufficiently long equilibration phase, perform  $10^4$  to  $10^5$  sweeps, where on average each spin is offered a flip once.

1. Generate and discuss graphical snapshots of the system for  $k_B T = 1$  and  $k_B T = 3$ .

Consider multiple temperatures  $k_B T \in [1.5, 3]$  for the following parts of the exercise. The range around the critical temperature (in the thermodynamic limit)

$$k_B T_c = \frac{2}{\ln(1 + \sqrt{2})} \approx 2.27$$

is particularly interesting, so it is recommended to resolve the temperature more precisely in this range. For parts of the exercise where plots as a function of time are required, it is sufficient to create plots for the two boundary values of the temperature range and for an intermediate value.

2. First, examine the equilibration phase by measuring the average energy per spin

$$e(t) = \frac{E(t)}{N} = \frac{\langle \mathcal{H}(t) \rangle}{N}$$

as a function of simulation time  $t$ , where  $N$  is the total number of spins. How long do you have to wait until the result becomes independent of the initial conditions? Examine both initial conditions.

3. Next, consider the time after equilibration. Calculate the averages of the energy, the magnetization

$$\langle m \rangle = \left\langle \frac{1}{N} \sum_i \sigma_i \right\rangle$$

and the absolute value of the magnetization

$$\langle |m| \rangle = \left\langle \frac{1}{N} \left| \sum_i \sigma_i \right| \right\rangle$$

per spin. How does the behavior of the system differ above and below  $T_c$ ? How does the magnetization  $\langle m \rangle(t)$  behave as a function of simulation time at different temperatures?

4. In your simulation, calculate the specific heat per spin from the energy fluctuations

$$c(T) = \frac{\langle \mathcal{H}^2 \rangle - \langle \mathcal{H} \rangle^2}{k_B T^2 N}.$$