2D_Ising_Notes

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1 2D Ising Model

In this exercise, you will simulate a 2D Ising model on a square lattice. The Ising model is a simple model to demostrate ferromagnetism. It consists classical spins arranged in a lattice with nearest-neighbor interactions. The model can also be extended to higher dimensions.

2 Hamiltonian:

2.0.1
$$H = J\Sigma_{\langle ij \rangle}\sigma_i^z \cdot \sigma_j^z - h\Sigma_i\sigma_i^z$$

where $\langle ij \rangle$ = nearest neighbor couplings. For simplicity assume that $\sigma = \pm 1$. *J* is the coupling strength (*J* < 0 for ferromagnetic interactions and *J* > 0 for antiferromagnetic interactions). *h* is the magnetic field. Set it to zero unless otherwise mentioned.

The spin lattice can be realized using a 2d (Integer) matrix of size *L*, e.g., lattice[1:L,1:L]. You can choose L = 20 to start with. Of course you can increase *L* later on.

Choose periodic boundary conditions, such that the spin corresponding to [i,L+1] = [i,1] and [L+1,j] = [1,j]

Choose |J| = 1 such that your temperature scale is in terms of *J*. Also choose $k_B = 1$, such that $\beta = 1/T$.

2.0.2 Start from a (high temperature) configuration where the spins are randomly distributed i.e., choose $\sigma_i = \pm 1$ with a probability 1/2.

```
In []: # for each site [i,j]
    n = rand();
    if(n > 0.5)
        lattice[x,y]=1;
    else
        lattice[x,y]=-1;
```

- **2.0.3** Cool the system down in steps of *tstep*. E.g., you can choose $t_{hi} = 5.0$ and $t_{low} = 0.0$ with tstep = 0.5, the number of temperature steps $nstep = \frac{t_{hi} t_{lo}}{tstep}$
- 2.0.4 At each temperature, thermalize the system using the Metropolis algorithm as described below:

3 Metropolis Algorithm:

- 3.0.1 Markov-Chain realized through changing the configuration of a single spin
 - a) Choose a random site (i,j)

In []: x=rand(1:L); y=rand(1:L)

b) Calculate ΔE , the energy cost of flipping a the spin at site [i,j]

```
In []: de = 2*h*lattice[i,j]- 2*j1*lattice[i,j]*(lattice[i,j+1]+lattice[i,j-1]+lattice[i-1,j]
```

Be careful near the edge of the lattie, eg, if you choose a spin at [L,j] then the site [L+1,j] corresponds to [1,j] Hint: You can use the following form to find out the adjacent site (verify that it works!!)

In []: i1 = mod(i+1-1,L)+1; i2 = mod(i-1-1,L)+1

c) Choose the new configuration if

 $\rightarrow \Delta E < 0$, or \rightarrow with probability $\exp(\beta \Delta E)$

- d) Repeat steps a) through c) for at least $\approx L^3$ iterations. Better to choose even more iterations e.g., $100L^2$.
- 3.1 Visualize the system for different temperatures. You can save a copy of the configuration at each temperature step and plot the lattice at the end of the run.

```
In []: # Save a copy of the lattice in some other matrix. eg,
Lattice_save[iteration,:,:] = lattice[:,:]
# ...
# ...
# Later on, you can plot the lattice, the different iterations corresponds to differen
imshow(Lattice_save[iteration,:,:], cmap="gray", interpolation="none")
```