

## 2d Ising model

May 18, 2022

```
[ ]: import numpy as np
import matplotlib.pyplot as plt
import numba
from numba import njit
from scipy.ndimage import convolve, generate_binary_structure

N = 64
init_random = np.random.random((N,N))
lattice_n = np.zeros((N, N))
lattice_n[init_random>=0.3] = 1
lattice_n[init_random<0.3] = -1

plt.imshow(lattice_n)
plt.title('initial configuration')
```

Metropolis algorithm for the two-dimensional Ising model

1. choose a random  $64 \times 64$  spin configuration  $\{S\}^1$
2. flip random one site's spin, and get a new configuration  $\{s\}_{\text{bar}}$
3. calculate the  $\alpha = w(\{S\}^1) / w(\{S\}_{\text{bar}}) = \exp(-\beta \Delta E)$ , where  $\Delta E$  is the energy difference of two configuration
4. choose a random number  $\gamma$  between  $[0,1]$ , and compare  $\gamma$  with  $\alpha$ , if  $\alpha > \gamma$ ,  $\{S\}^2 = \{S\}_{\text{bar}}$ , otherwise  $\{S\}^2 = \{S\}^1$
5. iterate the following procedure for 10000 times
6. calculate average magnetic field,  $m = \text{sum of } (s_i) / L / N$

```
[2]: def metropolis(spin_arr, times, T, h):
    BJ=1/T
    N = len(spin_arr)
    spin_arr = spin_arr.copy()
    net_spins = np.zeros(times-1)
    for t in range(0,times-1):
        # 2. pick random point on array and flip spin
        x = np.random.randint(0,N)
        y = np.random.randint(0,N)
        spin_i = spin_arr[x,y] #initial spin
```

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spin_f = spin_i*-1 #proposed spin flip

# compute change in energy
E_i = 0
E_f = 0
E_i += -spin_i*spin_arr[(x-1+N)%N,y]
E_f += -spin_f*spin_arr[(x-1+N)%N,y]
E_i += -spin_i*spin_arr[(x+1+N)%N,y]
E_f += -spin_f*spin_arr[(x+1+N)%N,y]
E_i += -spin_i*spin_arr[x,(y-1+N)%N]
E_f += -spin_f*spin_arr[x,(y-1+N)%N]
E_i += -spin_i*spin_arr[x,(y+1+N)%N]
E_f += -spin_f*spin_arr[x,(y+1+N)%N]
E_i += -spin_i*h
E_f += -spin_f*h

# 3 / 4. change state with designated probabilities
dE = E_f-E_i
if dE<=0:
    spin_arr[x,y]=spin_f
elif (dE>0)*(np.random.random() < np.exp(-BJ*dE)):
    spin_arr[x,y]=spin_f

net_spins[t] = spin_arr.sum()

return net_spins, spin_arr

```

```

[3]: times = 10000
h=0
T = [0.1,0.5,2.0,10.0]

spins0 , spin_arr0 = metropolis(lattice_n, times, T[0],h)
plt.imshow(spin_arr0)
plt.title('2d Ising model with iterations =' +str(times)+' T='+str(T[0])+'
↳h='+str(h))
spins0.sum()/times/N/N

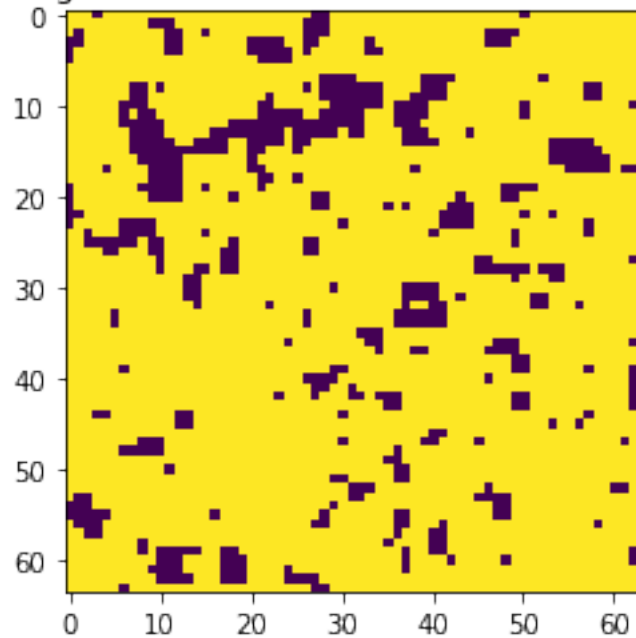
```

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[3]: 0.570125244140625

```

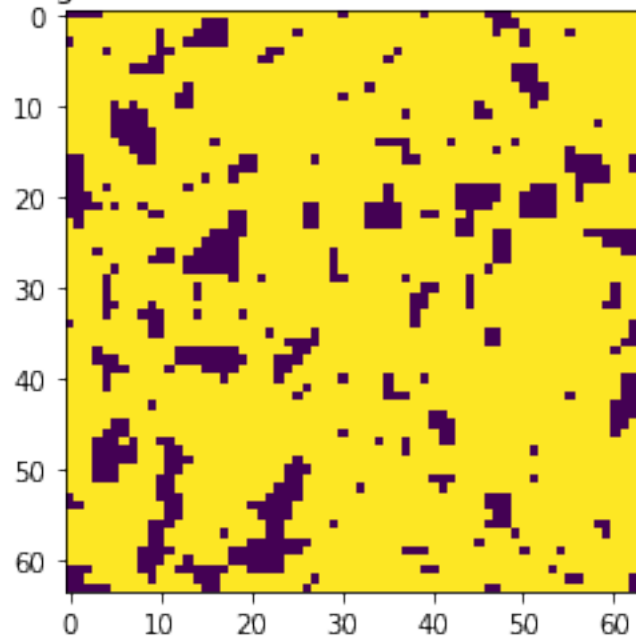
2d Ising model with iterations =10000 T=0.1 h=0



```
[4]: spins1 , spin_arr1 = metropolis(lattice_n, times, T[1],0)
plt.imshow(spin_arr1)
plt.title('2d Ising model with iterations =' +str(times)+' T='+str(T[1])+'  
↪h='+str(h))
```

```
[4]: Text(0.5, 1.0, '2d Ising model with iterations =10000 T=0.5 h=0')
```

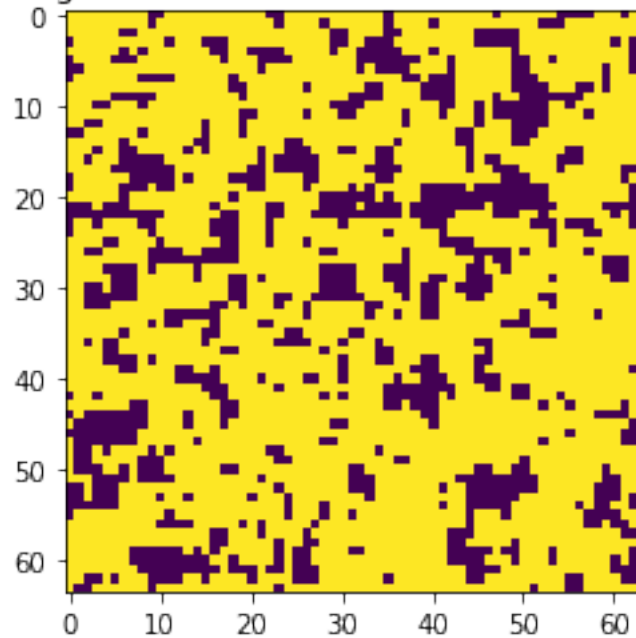
2d Ising model with iterations =10000 T=0.5 h=0



```
[5]: spins2 , spin_arr2 = metropolis(lattice_n, times, T[2],0)
plt.imshow(spin_arr2)
plt.title('2d Ising model with iterations =' + str(times) + ' T=' + str(T[2]) + '
↪ h=' + str(h))
```

```
[5]: Text(0.5, 1.0, '2d Ising model with iterations =10000 T=2.0 h=0')
```

2d Ising model with iterations =10000 T=2.0 h=0

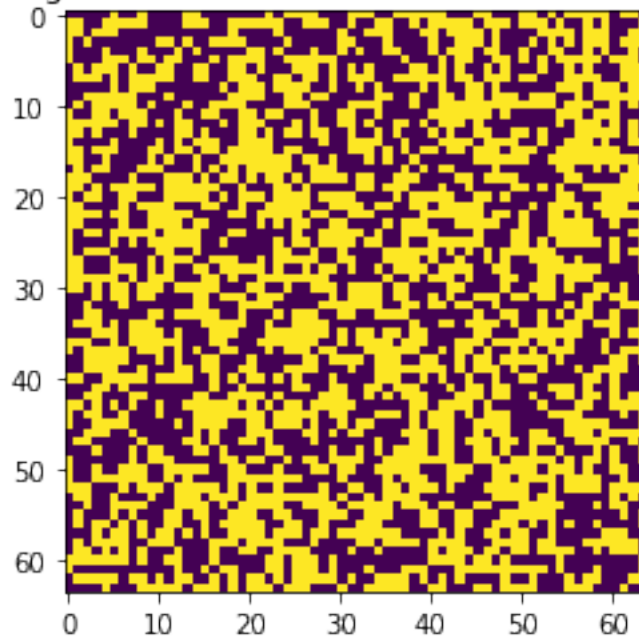


```
[6]: spins3 , spin_arr3 = metropolis(lattice_n, times, T[3],0)
plt.imshow(spin_arr3)
plt.title('2d Ising model with iterations =' +str(times)+' T='+str(T[3])+'  

↳h='+str(h))
spins3.sum()/times/N/N
```

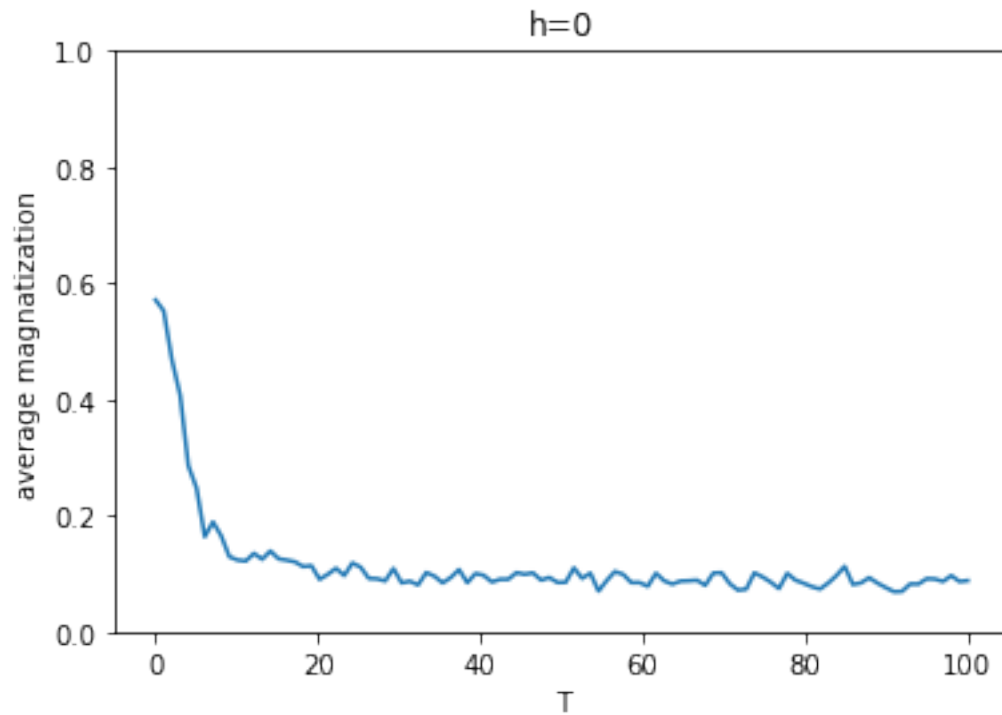
[6]: 0.139030517578125

2d Ising model with iterations =10000 T=10.0 h=0



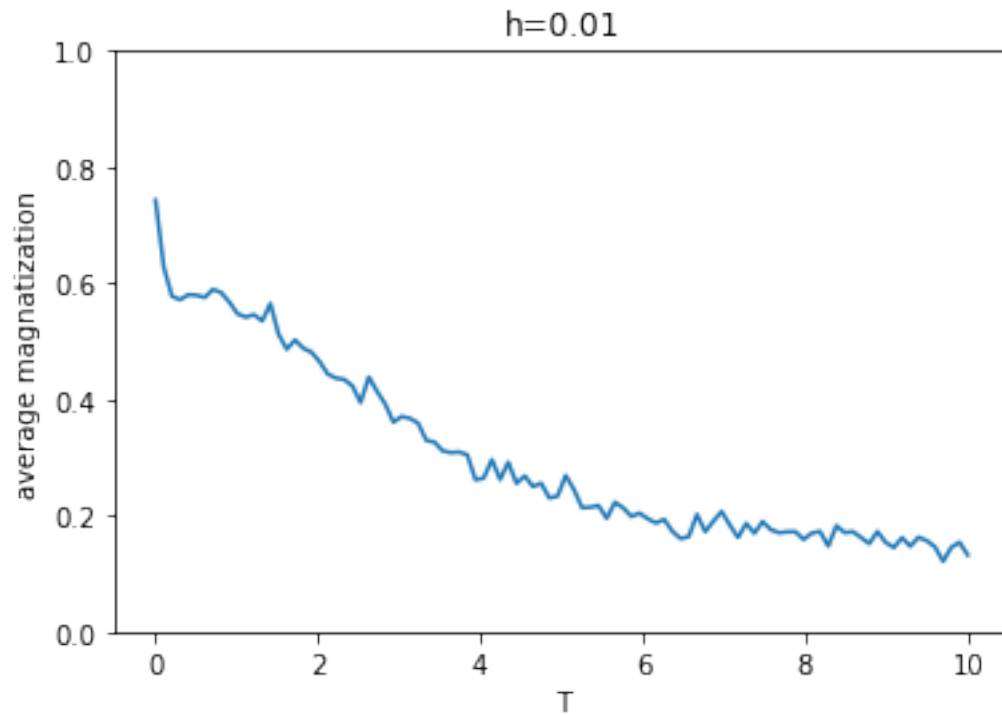
```
[7]: steps = 100
T_list = np.linspace(0.0001,100,steps)
h=0
average_mag = np.zeros(steps)
i=0
for T in T_list:
    spins_h, arrays_h =metropolis(lattice_n, times, T,h)
    average_mag[i] = spins_h.sum()/times/N/N
    i+=1
plt.ylim([0,1])
plt.plot(T_list,average_mag)
plt.xlabel('T')
plt.ylabel('average magnatization')
plt.title('h='+str(h))
```

```
[7]: Text(0.5, 1.0, 'h=0')
```



```
[8]: steps = 100
T_list = np.linspace(0.0001,10,steps)
h=0.01
average_mag = np.zeros(steps)
i=0
for T in T_list:
    spins_h, arrays_h =metropolis(lattice_n, times, T,h)
    average_mag[i] = spins_h.sum()/times/N/N
    i+=1
plt.plot(T_list,average_mag)
plt.xlabel('T')
plt.ylabel('average magnetization')
plt.title('h='+str(h))
plt.ylim([0,1])
```

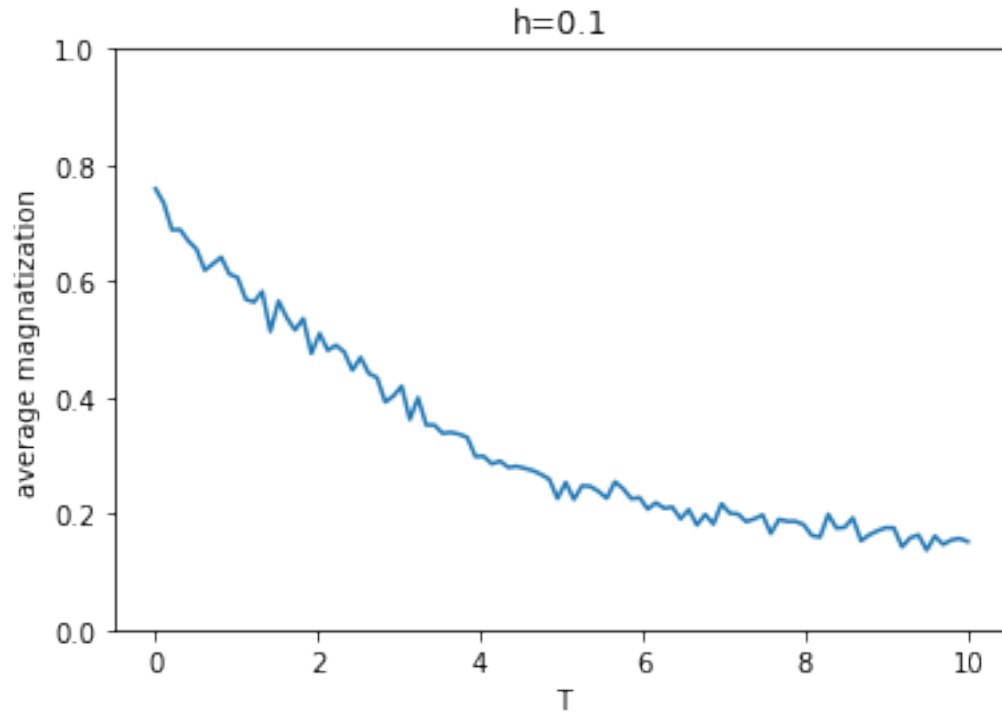
```
[8]: (0.0, 1.0)
```



```
[9]: steps = 100
T_list = np.linspace(0.0001,10,steps)
h=0.1
average_mag = np.zeros(steps)
i=0
for T in T_list:
    spins_h, arrays_h =metropolis(lattice_n, times, T,h)
    average_mag[i] = spins_h.sum()/times/N/N
    i+=1
plt.plot(T_list,average_mag)
plt.xlabel('T')
plt.ylabel('average magnetization')
plt.title('h='+str(h))
plt.ylim([0,1])
```

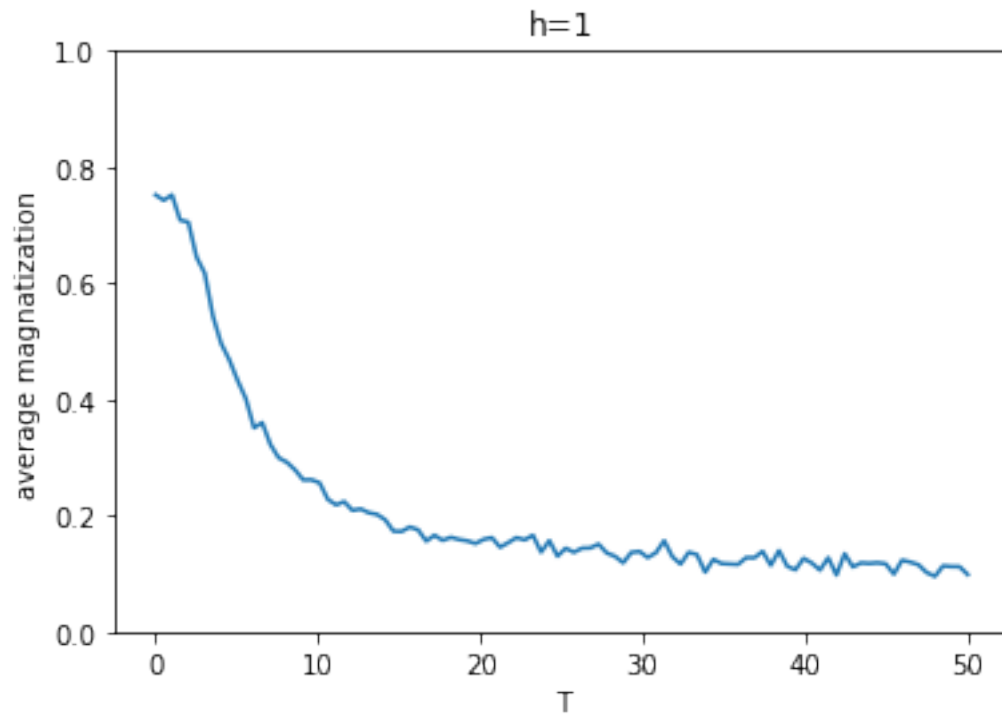
```
[9]: (0.0, 1.0)
```





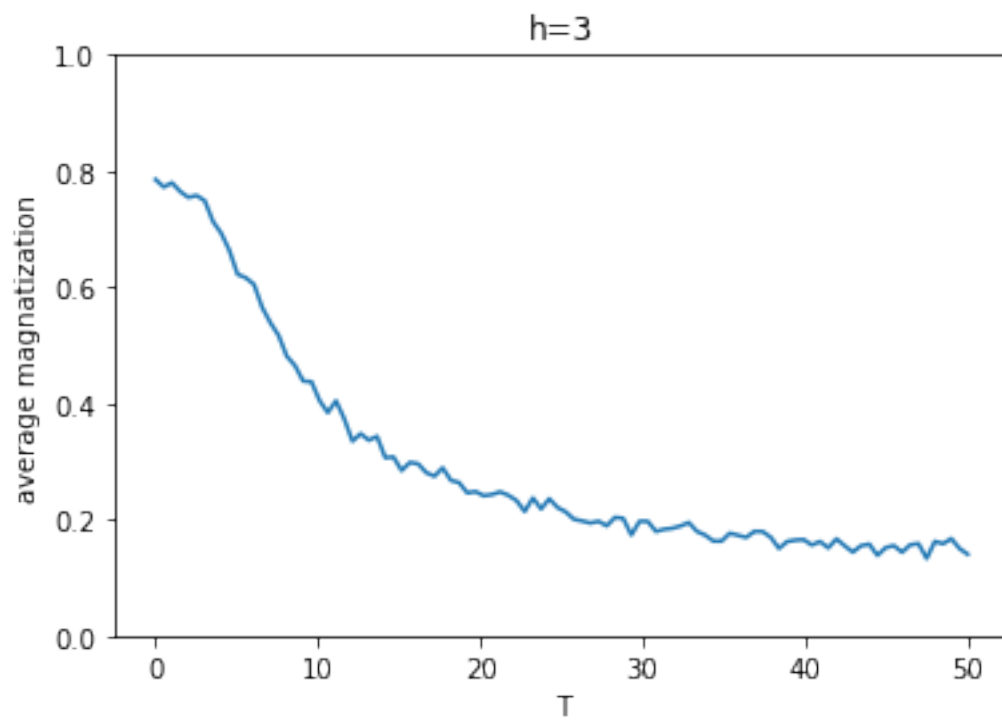
```
[10]: steps = 100
T_list = np.linspace(0.0001,50,steps)
h=1
average_mag = np.zeros(steps)
i=0
for T in T_list:
    spins_h, arrays_h =metropolis(lattice_n, times, T,h)
    average_mag[i] = spins_h.sum()/times/N/N
    i+=1
plt.plot(T_list,average_mag)
plt.xlabel('T')
plt.ylabel('average magnetization')
plt.title('h='+str(h))
plt.ylim([0,1])
```

```
[10]: (0.0, 1.0)
```



```
[11]: steps = 100
T_list = np.linspace(0.0001,50,steps)
h=3
average_mag = np.zeros(steps)
i=0
for T in T_list:
    spins_h, arrays_h =metropolis(lattice_n, times, T,h)
    average_mag[i] = spins_h.sum()/times/N/N
    i+=1
plt.plot(T_list,average_mag)
plt.xlabel('T')
plt.ylabel('average magnetization')
plt.title('h='+str(h))
plt.ylim([0,1])
```

```
[11]: (0.0, 1.0)
```



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