

In [3]:

```
1 import numpy as np
2 import matplotlib.pyplot as plt
3
4
5 betas = [0.5, 0.6, 0.7, 0.8, 0.83, 0.84, 0.85, 0.9]
6 # betas = [1]
7 size = 64
8
9
10 def dist(x, row, col, label, beta):
11     energy = np.zeros(4)
12     if row + 1 <= 63:
13         energy[0] = int(x[row + 1, col] == label)
14     if row - 1 >= 0:
15         energy[1] = int(x[row - 1, col] == label)
16     if col + 1 <= 63:
17         energy[2] = int(x[row, col + 1] == label)
18     if col - 1 >= 0:
19         energy[3] = int(x[row, col - 1] == label)
20     energy = np.sum(energy)
21     return np.exp(beta * energy)
22
```

```

In [*]: 1 for beta in betas:
2         n_sweeps = 0
3         x_1 = np.ones((size, size), dtype=np.int16)
4         x_2 = np.zeros((size, size), dtype=np.int16)
5         sum_1_arr = np.sum(x_1)
6         sum_2_arr = np.sum(x_2)
7
8         while True:
9             row_i = np.random.permutation(size)
10            col_i = np.random.permutation(size)
11            for row in row_i:
12                for col in col_i:
13                    denom = dist(x_1, row, col, 1, beta) + dist(x_1, row, col, 0, beta)
14                    prob_x1 = dist(x_1, row, col, 1, beta) / denom
15                    denom_2 = dist(x_2, row, col, 1, beta) + dist(x_2, row, col, 0, beta)
16                    prob_x2 = dist(x_2, row, col, 1, beta) / denom_2
17
18                    rand = np.random.uniform()
19                    x_1[row, col] = 1 if prob_x1 > rand else 0
20                    x_2[row, col] = 1 if prob_x2 > rand else 0
21
22                sum_1 = np.sum(x_1)
23                sum_2 = np.sum(x_2)
24                sum_1_arr = np.append(sum_1_arr, sum_1)
25                sum_2_arr = np.append(sum_2_arr, sum_2)
26                n_sweeps += 1
27                if sum_1 == sum_2:
28                    break
29
30            print('beta: %s, n_sweeps: %d' % (beta, n_sweeps))
31
32            fig = plt.figure()
33            plt.plot(range(n_sweeps + 1), sum_1_arr, color='green', linewidth=0.9)
34            plt.plot(range(n_sweeps + 1), sum_2_arr, color='darkblue', linewidth=0.9)
35            plt.xlabel('Sweeps')
36            plt.ylabel('Sum of Image')
37            plt.grid()
38            plt.title('Total Magnetization of Ising Model with beta = %s' % beta)
39            plt.legend(['White Chain (Upper Bound)', 'Black Chain (Lower Bound)'], loc='upper right')
40            fig.savefig('./exact-sampling-imgs/chains-beta=' + str(beta) + '.png')
41
42            fig = plt.figure()
43            plt.imshow(x_1, cmap='gray')
44            plt.title('Ising Sample at Coalescence with beta = %s' % beta)
45            fig.savefig('./exact-sampling-imgs/sample-beta=' + str(beta) + '.png')
46
47            # do afterwards
48            # fig = plt.figure()
49            # n_sweeps = np.array([25, 53, 69, 458, 372, 887, 883, 15330])
50            # plt.plot(betas[0:8], n_sweeps)
51            # plt.xlabel('Beta')
52            # plt.ylabel('Sweeps')
53            # plt.grid()
54            # plt.title('Coalescence Time Tau for Beta Values')
55            # fig.savefig('./exact-sampling-imgs/tau-over-beta.png')
56

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beta: 0.5, n_sweeps: 19
beta: 0.6, n_sweeps: 55
beta: 0.7, n_sweeps: 84

```

