## Question 1

Outline a Gibbs sampling algorithm (in pseudocode) that iterates over the pixels in the image and samples each yij given its Markov blanket. Use the simple approach of sweeping across the image in row-major fashion on every iteration of the algorithm. Thus, an "iteration" will generate a complete new sample of y. Allow for a burn-in of B iterations, followed by draws of S samples. You may assume and are fixed constants.

#### Solution

```
Initialize starting values of y_i,j for i = 1, j = 1, M,N, ita, beta;

for B do (while not at convergence):

pick an order of the M × N variables;

for each variable y_i,j do:

sample y_i,j based on P(y_i,j|y_Nbr(i,j));

update y_i,j to Y;

end

end

for S do (while at convergence):

pick an order of the M × N variables;

for each variable y_i,j do:

sample y_i,j based on P(y_i,j|y_Nbr(i,j));

update y_i,j to Y;

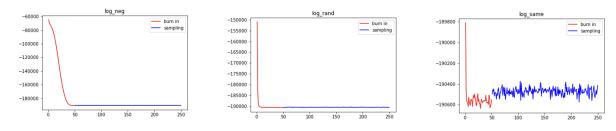
end

end
```

### Question 2

- 1. Do all three seem to be converging to the same general region of the posterior, or are some obviously suboptimal?
- 2. Does the burn-in seem to be adequate in length?
- 3. Is there substantial fluctuation from iteration to iteration, indicating that the chain is mixing well, or does it become stuck at particular energies for several iterations at a time?

### Solution



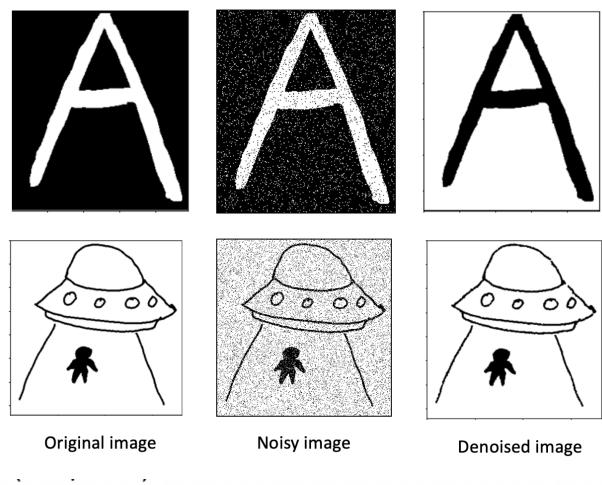
Section	Log_neg	Log_rand	Log_same
1	Converges to the region between -180000 and -190000	Converges to the region between -190000 and -192000	Converges to the region between -190400 and -190700
2	The assigned length of burn-in is reasonable	The assigned length of burn-in is reasonable, but the value converged approximately after 20th iteration	Can obviously observe the difference between burn-in and sample, therefore, the length is reasonable
3	No significant flactuations here	No significant flactuations	The substantial fluctuation from iteration to iteration is observed (the chain is mixing well)

- 1. If generalize, then all three converge to the same general region.
- 2. Burn-in seems adequate in length, but the log\_rand burn-in length could be decreased.
- 3. The substantial fluctuation from iteration to iteration can be observed for log\_same

# Question 3

- 1. Prepare a figure for each the two images, showing the original, the noisy version, and the restoration side by side.
- 2. Report the restoration error for each image.

### Solution



restoration error for image a: 0.992262 restoration error for image b: 0.004810

# Problem 4

How many hours did you spend on this assignment?

### Solution

15 to 20 hours