## INF 559: Homework 1

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```
from google.colab import drive
drive.mount('/content/gdrive', force_remount=True)

Mounted at /content/gdrive

import numpy as np
import matplotlib.pyplot as plt
import time
import random
np.set_printoptions(suppress=True) # Suppress scientific notation while printing numb
%matplotlib inline
```

# 2. Plotting latency and bandwidth

a. Open the test file in unbuffered mode

b. Sequentially read [1, 4, 16, 64, 256, 1024, 41024, 161024, 641024, 2561024, 1024\*1024] size of 4KB. Measure the latency for each iteration in terms of wall-clock time.

```
Q2 = testdata
blocks = [1,4,16,64,256,1024,4*1024,16*1024,64*1024,256*1024,1024*1024]
size = 4
len(blocks)

Wall_clock_seq = []
for i in range(len(blocks)):
```

```
start = time.time()
  Q2.readline(blocks[i]*4)
  end = time.time()
  wall clock seq.append(end-start)
wall clock seq
 [0.00079345703125,
     1.6927719116210938e-05,
     4.8160552978515625e-05,
     0.00013756752014160156,
     6.723403930664062e-05,
     1.049041748046875e-05,
     0.012387275695800781,
     0.014492034912109375,
     0.00021076202392578125,
     0.0008184909820556641,
     0.00146007537841796881
```

c. Repeat 2b with random reads instead of sequential.

```
rand_pos = random.sample(range(0,11), 11)
rand pos
[9, 6, 10, 0, 5, 3, 1, 2, 4, 7, 8]
wall clock rand = []
for j in rand pos:
  begin = time.time()
  Q2.readline(blocks[j]*4)
  over = time.time()
  wall clock rand.append(over-begin)
wall clock rand
 [0.007957696914672852,
     0.0001499652862548828,
     0.0002536773681640625,
     7.867813110351562e-06,
     0.0020613670349121094,
     0.00024175643920898438,
     2.9802322387695312e-05,
     9.274482727050781e-05,
     0.0002567768096923828,
     0.0009310245513916016,
     0.000270843505859375]
```

d. Plot the latencies measured in 2b and 2c against the number of blocks read. B
 should appear on the same plot and the number of blocks should be scaled logar
 Briefly describe your observations from this plot.

```
import numpy as np
import matplotlib.pyplot as plt
import pandas as pd

lat_seq = pd.DataFrame(blocks)
lat_seq.rename(columns={0:'No. of blocks'})
lat_seq['Latency(seconds)'] = wall_clock_seq
Lat_Seq = lat_seq.rename(columns={0:'No.of blocks'})
Lat_Seq
```

No.of blocks Latency(seconds)

| 0  | 1       | 0.000793 |
|----|---------|----------|
| 1  | 4       | 0.000017 |
| 2  | 16      | 0.000048 |
| 3  | 64      | 0.000138 |
| 4  | 256     | 0.000067 |
| 5  | 1024    | 0.000010 |
| 6  | 4096    | 0.012387 |
| 7  | 16384   | 0.014492 |
| 8  | 65536   | 0.000211 |
| 9  | 262144  | 0.000818 |
| 10 | 1048576 | 0.001460 |

```
#convert random latency data into dataframe
rand_pos
rand_pos_4 = []
for m in rand_pos:
    rand_pos_4.append(4**m)
rand_pos_4
lat_rand = pd.DataFrame(rand_pos_4)
latency = lat_rand.rename(columns={0:'No. of blocks'})
latency['Latency(seconds)_Random'] = wall_clock_rand
LATENCY = latency.sort_values(by=['No. of blocks'])
LATENCY
```

 $\Box$ 

|    | No. of | blocks  | Latency(seconds)_Random |
|----|--------|---------|-------------------------|
| 3  |        | 1       | 0.000008                |
| 6  |        | 4       | 0.000030                |
| 7  |        | 16      | 0.000093                |
| 5  |        | 64      | 0.000242                |
| 8  |        | 256     | 0.000257                |
| 4  |        | 1024    | 0.002061                |
| 1  |        | 4096    | 0.000150                |
| 9  |        | 16384   | 0.000931                |
| 10 |        | 65536   | 0.000271                |
| 0  |        | 262144  | 0.007958                |
| 2  |        | 1048576 | 0.000254                |

LATENCY['Latency(seconds)\_Sequential'] = wall\_clock\_seq

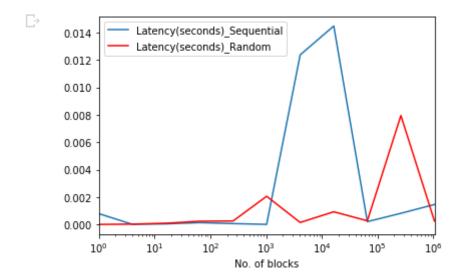
### LATENCY

| $\Box$ |    | No. of blocks | Latency(seconds)_Random | Latency(seconds)_Sequential |
|--------|----|---------------|-------------------------|-----------------------------|
|        | 3  | 1             | 0.000008                | 0.000793                    |
|        | 6  | 4             | 0.000030                | 0.000017                    |
|        | 7  | 16            | 0.000093                | 0.000048                    |
|        | 5  | 64            | 0.000242                | 0.000138                    |
|        | 8  | 256           | 0.000257                | 0.000067                    |
|        | 4  | 1024          | 0.002061                | 0.000010                    |
|        | 1  | 4096          | 0.000150                | 0.012387                    |
|        | 9  | 16384         | 0.000931                | 0.014492                    |
|        | 10 | 65536         | 0.000271                | 0.000211                    |
|        | 0  | 262144        | 0.007958                | 0.000818                    |
|        | 2  | 1048576       | 0.000254                | 0.001460                    |

test = LATENCY
test['Blocks'] = ['4^0','4^1','4^2','4^3','4^4','4^5','4^6','4^7','4^8','4^9','4^10',

|    | No. of blocks | Latency(seconds)_Random | Latency(seconds)_Sequential | Blocks |
|----|---------------|-------------------------|-----------------------------|--------|
| 3  | 1             | 0.000008                | 0.000793                    | 4^0    |
| 6  | 4             | 0.000030                | 0.000017                    | 4^1    |
| 7  | 16            | 0.000093                | 0.000048                    | 4^2    |
| 5  | 64            | 0.000242                | 0.000138                    | 4^3    |
| 8  | 256           | 0.000257                | 0.000067                    | 4^4    |
| 4  | 1024          | 0.002061                | 0.000010                    | 4^5    |
| 1  | 4096          | 0.000150                | 0.012387                    | 4^6    |
| 9  | 16384         | 0.000931                | 0.014492                    | 4^7    |
| 10 | 65536         | 0.000271                | 0.000211                    | 4^8    |
| 0  | 262144        | 0.007958                | 0.000818                    | 4^9    |
| 2  | 1048576       | 0.000254                | 0.001460                    | 4^10   |

```
ax = plt.gca()
test.plot(kind='line',x='No. of blocks',y='Latency(seconds)_Sequential',ax=ax)
test.plot(kind='line',x='No. of blocks',y='Latency(seconds)_Random', color='red',ax=a:
ax.set_xscale('log')
plt.show()
```



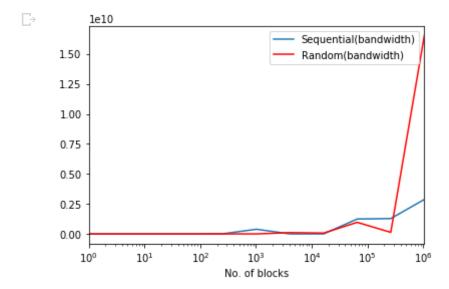
e. Calculate the bandwidth for each iteration of 2b and 2c using the latency and a the results in the same manner as latency and briefly describe your observations.

| $\Box$ | No. of blocks | Latency(seconds)_Random | Latency(seconds)_Sequential | Blocks |
|--------|---------------|-------------------------|-----------------------------|--------|
| 3      | 1             | 0.000008                | 0.000793                    | 4^0    |
| 6      | 4             | 0.000030                | 0.000017                    | 4^1    |
| 7      | 16            | 0.000093                | 0.000048                    | 4^2    |
| 5      | 64            | 0.000242                | 0.000138                    | 4^3    |
| 8      | 256           | 0.000257                | 0.000067                    | 4^4    |
| 4      | 1024          | 0.002061                | 0.000010                    | 4^5    |
| 1      | 4096          | 0.000150                | 0.012387                    | 4^6    |
| 9      | 16384         | 0.000931                | 0.014492                    | 4^7    |
| 10     | 65536         | 0.000271                | 0.000211                    | 4^8    |
| 0      | 262144        | 0.007958                | 0.000818                    | 4^9    |
| 2      | 1048576       | 0.000254                | 0.001460                    | 4^10   |

bandwidth\_df['Sequential(bandwidth)'] = bandwidth\_df['No. of blocks']\*4/bandwidth\_df[
bandwidth\_df['Random(bandwidth)'] = bandwidth\_df['No. of blocks']\*4/bandwidth\_df['Latbandwidth\_df

| ₽ | No. of | blocks  | Latency(seconds)_Random | Latency(seconds)_Sequential | Blocks |
|---|--------|---------|-------------------------|-----------------------------|--------|
| _ | 3      | 1       | 0.000008                | 0.000793                    | 4^0    |
|   | 6      | 4       | 0.000030                | 0.000017                    | 4^1    |
|   | 7      | 16      | 0.000093                | 0.000048                    | 4^2    |
|   | 5      | 64      | 0.000242                | 0.000138                    | 4^3    |
|   | 8      | 256     | 0.000257                | 0.000067                    | 4^4    |
|   | 4      | 1024    | 0.002061                | 0.000010                    | 4^5    |
|   | 1      | 4096    | 0.000150                | 0.012387                    | 4^6    |
|   | 9      | 16384   | 0.000931                | 0.014492                    | 4^7    |
| 1 | 10     | 65536   | 0.000271                | 0.000211                    | 4^8    |
|   | 0      | 262144  | 0.007958                | 0.000818                    | 4^9    |
|   | 2      | 1048576 | 0.000254                | 0.001460                    | 4^10   |

```
ax = pit.gca()
bandwidth_df.plot(kind='line',x='No. of blocks',y='Sequential(bandwidth)',ax=ax)
bandwidth_df.plot(kind='line',x='No. of blocks',y='Random(bandwidth)', color='red',ax=ax.set_xscale('log')
plt.show()
```



### 3. Monte-Carlo simulations

#2b

a. Run 10 simulations of steps 2b and 2c and store the results.

```
For each of the dataframe created below, each column represent a simulation, each
row represents a single iteration within that simulation.
              simulation1
                            simulation2
                                          simulation3... simulation10
iteration 1
iteration 2
iteration 10
sim_seq = pd.DataFrame()# empty dataframe store all simulation of Sequential case
sim rand = pd.DataFrame()# empty dataframe store all simulation of Random case
for sim in range(10):
 temp_seq = []
  temp rand = []
  rand_pos = random.sample(range(0,11), 11)
  for i in range(len(blocks)):
    #add iteration into a temp Squential list
```

```
start = time.time()
    Q2.readline(blocks[i]*4)
    end = time.time()
    temp_seq.append(end-start)
    #add iteration into a temp Random list
    begin = time.time()
    Q2.readline(blocks[rand_pos[i]]*4)
    over = time.time()
    temp_rand.append(over-begin)
    [temp_rand for _,temp_rand in sorted(zip(rand_pos,temp_rand))]
    sim_seq[sim] = temp_seq
    sim_rand[sim] = temp_rand
```

|    | 0        | 1        | 2        | 3        | 4        | 5        | 6        | 7        | 8        |
|----|----------|----------|----------|----------|----------|----------|----------|----------|----------|
| 0  | 0.000009 | 0.000004 | 0.000003 | 0.000523 | 0.000044 | 0.000019 | 0.000088 | 0.000053 | 0.000012 |
| 1  | 0.000375 | 0.000262 | 0.000071 | 0.000211 | 0.000040 | 0.001903 | 0.000037 | 0.000013 | 0.000077 |
| 2  | 0.000011 | 0.000155 | 0.000717 | 0.000984 | 0.000005 | 0.000148 | 0.000097 | 0.000002 | 0.000037 |
| 3  | 0.000136 | 0.000066 | 0.000375 | 0.000150 | 0.000034 | 0.005462 | 0.000037 | 0.000001 | 0.000089 |
| 4  | 0.000654 | 0.000006 | 0.000367 | 0.000003 | 0.000124 | 0.000037 | 0.000029 | 0.000016 | 300000.0 |
| 5  | 0.000005 | 0.000680 | 0.000149 | 0.000083 | 0.000003 | 0.000002 | 0.000036 | 0.000010 | 0.000002 |
| 6  | 0.000005 | 0.000088 | 0.000418 | 0.000190 | 0.000006 | 0.000002 | 0.000003 | 0.000001 | 0.000024 |
| 7  | 0.000093 | 0.000366 | 0.000242 | 0.001774 | 0.000599 | 0.000001 | 0.000016 | 0.000002 | 0.000059 |
| 8  | 0.000411 | 0.000136 | 0.000766 | 0.000038 | 0.000038 | 0.000017 | 0.000037 | 0.000002 | 0.000022 |
| 9  | 0.000088 | 0.000360 | 0.000110 | 0.000010 | 0.002491 | 0.000036 | 0.000010 | 0.000008 | 0.000003 |
| 10 | 0.000166 | 0.000070 | 0.000014 | 0.000051 | 0.005741 | 0.000013 | 0.000016 | 0.000001 | 0.000004 |

sim\_seq

E

 $\Box$ 

|    | 0        | 1        | 2        | 3        | 4        | 5        | 6        | 7        | 3        |
|----|----------|----------|----------|----------|----------|----------|----------|----------|----------|
| 0  | 0.000422 | 0.000019 | 0.000017 | 0.000018 | 0.000016 | 0.000020 | 0.000020 | 0.000036 | 0.000012 |
| 1  | 0.000021 | 0.000012 | 0.000012 | 0.000012 | 0.000010 | 0.000018 | 0.000002 | 0.000002 | 0.00001( |
| 2  | 0.000044 | 0.000051 | 0.000006 | 0.000005 | 0.000037 | 0.000044 | 0.000001 | 0.000016 | 0.000002 |
| 3  | 0.000027 | 0.000159 | 0.000165 | 0.000149 | 0.000042 | 0.000145 | 0.000002 | 0.000036 | 0.000001 |
| 4  | 0.000006 | 0.000255 | 0.000005 | 0.000134 | 0.000044 | 0.000004 | 0.000001 | 0.000013 | 0.000003 |
| 5  | 0.000183 | 0.002307 | 0.000079 | 0.000136 | 0.000038 | 0.000003 | 0.000001 | 0.000001 | 0.000052 |
| 6  | 0.000517 | 0.000078 | 0.000133 | 0.000133 | 0.000027 | 0.000030 | 0.000002 | 0.000028 | 0.000020 |
| 7  | 0.000016 | 0.000212 | 0.000005 | 0.000068 | 0.000033 | 0.000037 | 0.000011 | 0.000029 | 0.000003 |
| 8  | 0.000264 | 0.000069 | 0.000005 | 0.000607 | 0.001203 | 0.000013 | 0.000001 | 0.000037 | 0.000003 |
| 9  | 0.000006 | 0.001641 | 0.000299 | 0.000009 | 0.000101 | 0.000002 | 0.000002 | 0.000029 | 0.000029 |
| 10 | 0.000440 | 0.000005 | 0.000747 | 0.000028 | 0.001549 | 0.000001 | 0.000004 | 0.000036 | 0.000077 |

```
# Issue Encountered:
```

\* Each iteration of the random process is using different sequence, need to be specific saperately

\* Sequential case works great

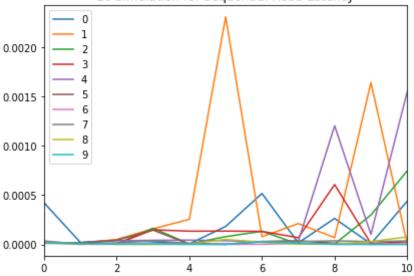
11 11 11

#PROBLEM SOLVED

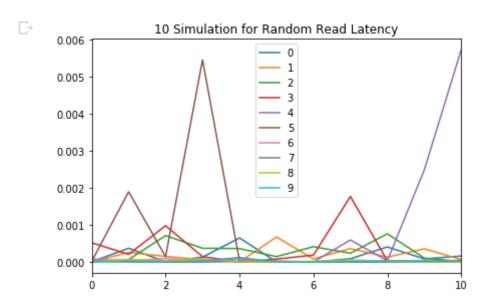
```
sim_seq.plot(subplots=False)
plt.tight_layout()
plt.title("10 Simulation for Sequential Read Latency")
plt.show()
```

 $\Box$ 

### 10 Simulation for Sequential Read Latency



```
sim_rand.plot(subplots=False)
plt.title("10 Simulation for Random Read Latency")
plt.tight_layout()
plt.show()
```



```
Sort list b according to list a
"""

a = [3,1,2,4,0,12]
b = [0.3,0.1,0.2,0.4,0,1.2]
[b for _,b in sorted(zip(a,b))]

[0, 0.1, 0.2, 0.3, 0.4, 1.2]
```

b. For each of the 11 iterations, calculate the mean and standard error4 over the 1

```
sim_rand_mean = sim_rand.mean(1)
sim_rand_se = sim_rand.sem(1)
sim_rand_data = pd.DataFrame()
sim_rand_data['Mean'] = sim_rand_mean
sim_rand_data['Standard Error'] = sim_rand_se

sim_seq_mean = sim_seq.mean(1)
sim_seq_se = sim_seq.sem(1)
sim_seq_data = pd.DataFrame()
sim_seq_data['Mean'] = sim_seq_mean
sim_seq_data['Standard Error'] = sim_seq_se
sim_rand_data
```

|   | Mean     | Standard Error |
|---|----------|----------------|
| 0 | 0.000077 | 0.000050       |
| 1 | 0.000299 | 0.000182       |
| 2 | 0.000216 | 0.000109       |
| 3 | 0.000638 | 0.000537       |
| 4 | 0.000134 | 0.000068       |
| 5 | 0.000098 | 0.000066       |
| 6 | 0.000074 | 0.000043       |
| 7 | 0.000317 | 0.000173       |
| 8 | 0.000150 | 0.000078       |

0.000244

0.000570

sim\_seq\_data

9 0.000315

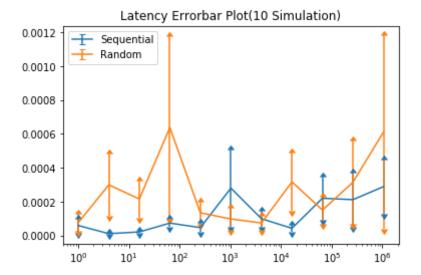
**10** 0.000611

D

|    | Mean     | Standard Error |
|----|----------|----------------|
| 0  | 0.000059 | 0.000040       |
| 1  | 0.000011 | 0.000002       |
| 2  | 0.000021 | 0.000006       |
| 3  | 0.000073 | 0.000023       |
| 4  | 0.000047 | 0.000027       |
| 5  | 0.000280 | 0.000226       |
| 6  | 0.000099 | 0.000049       |
| 7  | 0.000043 | 0.000020       |
| 8  | 0.000220 | 0.000125       |
| 9  | 0.000212 | 0.000161       |
| 10 | 0.000289 | 0.000161       |

c. Use the results of 3b to generate errorbar plots for latency and bandwidth. Aga
 results should be on the same plot and the number of blocks should be scaled lo your observations from these plots.

```
ax = plt.gca()
plt.errorbar(test['No. of blocks'],sim_seq_data.Mean,yerr=sim_seq_data['Standard Erro
plt.errorbar(test['No. of blocks'],sim_rand_data.Mean,yerr=sim_rand_data['Standard Err
ax.set_xscale('log')
plt.title('Latency Errorbar Plot(10 Simulation)')
plt.legend()
plt.show()
```



bandwidth\_rand = pd.DataFrame()
for i in range(10):
 bandwidth\_rand[i] = test['No. of blocks']\*4/sim\_rand[i]

bandwidth rand

| $\Box$ |    | 0            | 1            | 2            | 3            | 4            | 5            |     |
|--------|----|--------------|--------------|--------------|--------------|--------------|--------------|-----|
|        | 0  | 1.188661e+11 | 2.443359e+11 | 3.998224e+11 | 2.003666e+09 | 2.364541e+10 | 5.567147e+10 | 1.1 |
|        | 1  | 4.368689e+07 | 6.241551e+07 | 2.298310e+08 | 7.773696e+07 | 4.090445e+08 | 8.610384e+06 | 4.3 |
|        | 2  | 3.665039e+11 | 2.710660e+10 | 5.846522e+09 | 4.262706e+09 | 8.796093e+11 | 2.837449e+10 | 4.  |
|        | 3  | 2.948544e+04 | 6.056757e+04 | 1.066574e+04 | 2.667284e+04 | 1.165084e+05 | 7.323737e+02 | 1.( |
|        | 4  | 6.258604e+06 | 6.362915e+08 | 1.114852e+07 | 1.227134e+09 | 3.316577e+07 | 1.094259e+08 | 1.4 |
|        | 5  | 5.113056e+07 | 3.764873e+05 | 1.715243e+06 | 3.094357e+06 | 8.259552e+07 | 1.342177e+08 | 7.0 |
|        | 6  | 3.355443e+06 | 1.823610e+05 | 3.826047e+04 | 8.399107e+04 | 2.581110e+06 | 9.586981e+06 | 4.7 |
|        | 7  | 6.882960e+05 | 1.746490e+05 | 2.644684e+05 | 3.608488e+04 | 1.067762e+05 | 5.368709e+07 | 3.8 |
|        | 8  | 2.494174e+06 | 7.521834e+06 | 1.336747e+06 | 2.701237e+07 | 2.684355e+07 | 6.049250e+07 | 2.7 |
|        | 9  | 7.409108e+08 | 1.819179e+08 | 5.936888e+08 | 6.544712e+09 | 2.630914e+07 | 1.832519e+09 | 6.5 |
|        | 10 | 1.582031e+09 | 3.739835e+09 | 1.928968e+10 | 5.162026e+09 | 4.566457e+07 | 2.036133e+10 | 1.6 |

```
bandwidth_seq = pd.DataFrame()
for j in range(10):
   bandwidth_seq[j] = test['No. of blocks']*4/sim_seq[j]
bandwidth_seq
```

|    | 0            | 1            | 2            | 3            | 4            | 5            |     |
|----|--------------|--------------|--------------|--------------|--------------|--------------|-----|
| 0  | 2.481968e+09 | 5.638521e+10 | 6.194432e+10 | 5.864062e+10 | 6.467715e+10 | 5.298851e+10 | 5.2 |
| 1  | 7.898790e+08 | 1.402438e+09 | 1.321528e+09 | 1.347441e+09 | 1.561806e+09 | 9.162597e+08 | 7.6 |
| 2  | 9.509290e+10 | 8.259242e+10 | 6.515624e+11 | 8.377231e+11 | 1.127704e+11 | 9.613216e+10 | 2.9 |
| 3  | 1.458888e+05 | 2.511559e+04 | 2.431481e+04 | 2.688656e+04 | 9.478653e+04 | 2.750363e+04 | 2.3 |
| 4  | 7.158279e+08 | 1.607097e+07 | 8.589935e+08 | 3.046076e+07 | 9.286416e+07 | 1.010581e+09 | 2.8 |
| 5  | 1.399924e+06 | 1.109581e+05 | 3.224450e+06 | 1.887068e+06 | 6.795834e+06 | 9.761289e+07 | 2.  |
| 6  | 3.096856e+04 | 2.046002e+05 | 1.200516e+05 | 1.206994e+05 | 5.835553e+05 | 5.284163e+05 | 9.5 |
| 7  | 3.890369e+06 | 3.019521e+05 | 1.412818e+07 | 9.353152e+05 | 1.917396e+06 | 1.731842e+06 | 5.9 |
| 8  | 3.883334e+06 | 1.491308e+07 | 2.147484e+08 | 1.686285e+06 | 8.511628e+05 | 7.953643e+07 | 7.  |
| 9  | 1.018066e+10 | 3.992997e+07 | 2.193758e+08 | 7.429133e+09 | 6.467715e+08 | 3.926827e+10 | 2.7 |
| 10 | 5.962644e+08 | 4.997780e+10 | 3.509453e+08 | 9.397535e+09 | 1.692859e+08 | 1.832519e+11 | 6.4 |

```
bandwidth_rand_mean = bandwidth_rand.mean(1)
bandwidth_rand_se = bandwidth_rand.sem(1)
bandwidth_rand_data = pd.DataFrame()
bandwidth_rand_data['Mean'] = bandwidth_rand_mean
bandwidth_rand_data['Standard Error'] = bandwidth_rand_se
```

```
bandwidth_seq_mean = bandwidth_seq.mean(1)
bandwidth_seq_se = bandwidth_seq.sem(1)
bandwidth_seq_data = pd.DataFrame()
bandwidth_seq_data['Mean'] = bandwidth_seq_mean
bandwidth_seq_data['Standard Error'] = bandwidth_seq_se
bandwidth_rand_data
```

Г

|    | Mean         | Standard Error |
|----|--------------|----------------|
| 0  | 1.053671e+11 | 3.981219e+10   |
| 1  | 7.640423e+08 | 4.747678e+08   |
| 2  | 6.494658e+11 | 3.221172e+11   |
| 3  | 3.319265e+05 | 2.741738e+05   |
| 4  | 3.203019e+08 | 1.307934e+08   |
| 5  | 4.512527e+07 | 1.588971e+07   |
| 6  | 4.588615e+06 | 1.591553e+06   |
| 7  | 1.022802e+07 | 6.091596e+06   |
| 8  | 8.405579e+07 | 5.912490e+07   |
| 9  | 4.796002e+09 | 2.056154e+09   |
| 10 | 3.177794e+10 | 1.775003e+10   |

bandwidth\_seq\_data

| $\rightarrow$ |    | Mean         | Standard Error |
|---------------|----|--------------|----------------|
|               | 0  | 5.571436e+10 | 8.077423e+09   |
|               | 1  | 2.577028e+09 | 8.473206e+08   |
|               | 2  | 8.413756e+11 | 3.293869e+11   |
|               | 3  | 6.716192e+05 | 3.770713e+05   |
|               | 4  | 9.593658e+08 | 3.146505e+08   |
|               | 5  | 6.630763e+07 | 2.734945e+07   |
|               | 6  | 1.314165e+06 | 9.228664e+05   |
|               | 7  | 5.842941e+06 | 2.227603e+06   |
|               | 8  | 2.030637e+08 | 8.551019e+07   |
|               | 9  | 1.447540e+10 | 6.140918e+09   |
|               | 10 | 4.564976e+10 | 2.067349e+10   |

```
ax = plt.gca()
plt.errorbar(test['No. of blocks'],bandwidth_seq_data.Mean,yerr=bandwidth_seq_data['S
plt.errorbar(test['No. of blocks'],bandwidth_rand_data.Mean,yerr=bandwidth_rand_data[
ax.set_xscale('log')
plt.title('Bandwidth Errorbar Plot(10 Simulation)')
plt.legend()
plt.show()
```

