Analysis_Out

April 19, 2022

```
[1]: import warnings
warnings.filterwarnings('ignore')

[2]: import scrapbook as sb
import pandas as pd
import numpy as np
import seaborn as sns
import numpy as np
from statistics import mean , median
import matplotlib.pyplot as plt
```

1 Baseline

```
[3]: books = sb.read_notebooks("./BaseLine_Model_Output")
   baseLine_data = []
   for nb in books.notebooks:
        nbList=[nb.scraps['Stats Model MAE'].data,nb.scraps['Catboost MAE'].data]
        baseLine_data.append(nbList)
   df = pd.DataFrame(baseLine_data, columns = ["Stats Model","Catboost"])
   baseline_data = np.array(baseLine_data)
   stats = median(baseline_data[:,0])
   catboost = median(baseline_data[:,1])
```

2 GAN Model

<pandas.io.formats.style.Styler at 0x7fa181945970>

MEDIAN:

MSE 0.005936
MAE 0.060762
Euclidean Distance 0.342953
Manhattan Distance 1.215234

dtype: float64 0.06076171525809913

3 ABC GAN Analysis

3.1 ABC Pre-generator - Catboost

```
[5]: book = sb.read_notebooks("./ABC_GAN_Catboost")
     paramVal = [[1,1],[1,0.1],[1,0.01],[0.1,1],[0.1,0.1],[0.1,0.01],[0.01,1],[0.01,0.01]
     \hookrightarrow01,0.1],[0.01,0.01]]
     abc_mae = [[] for i in range(9)]
     abc_mae_skip = [[] for i in range(9)]
     abc_mae_mean = [[] for i in range(9)]
     abc_mae_skip_mean = [[] for i in range(9)]
     abc_weights = [[] for i in range(9)]
     prior_model = [[] for i in range(9)]
     abc_pre_generator = [[] for i in range(9)]
     for nb in book.notebooks:
         metrics1 = np.array(nb.scraps['ABC_GAN_1 Metrics'].data)
         metrics3 = np.array(nb.scraps['ABC_GAN_3 Metrics'].data)
         paramVar = float(nb.papermill_dataframe.iloc[0]['value'])
         paramBias = float(nb.papermill_dataframe.iloc[1]['value'])
         #Divide data according to parameters
         for i in range(9):
             if paramVar == paramVal[i][0] and paramBias == paramVal[i][1]:
                 for j in range(100):
                     abc_mae[i].append(metrics1[1,j])
                     abc_mae_skip[i].append(metrics3[1,j])
                 abc_weights[i].append(nb.scraps['Skip Connection Weight'].data)
```

```
prior_model[i].append(nb.scraps['Prior Model MSE'].data)
                 abc_pre_generator[i].append(nb.scraps['ABC Pre-generator MSE'].data)
                 abc_mae_skip_mean[i].append(mean(metrics3[1,:]))
                 abc_mae_mean[i].append(mean(metrics1[1,:]))
[6]: data = [[] for i in range(9)]
     for i in range(9):
         for j in range(len(abc_weights[i])):
             data[i].append([paramVal[i][0], paramVal[i][1],prior_model[i][j],
      abc_pre_generator[i][j],abc_weights[i][j],abc_mae_mean[i][j],abc_mae_skip_mean[i][j]])
         df = pd.DataFrame(data[i], columns = ['Variance', 'Bias', 'Prior Model MAE',
                                            'ABC pre-generator MAE', 'Skip Node
     →weight','ABC GAN MAE','ABC_GAN MAE (skip connection)'])
         display(df.round(5))
         print(df.median(axis=0))
       Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight
    0
              1
                               0.07855
                                                       1.36006
                                                                         0.11787
              1
                                                                         0.10816
    1
                    1
                               0.15301
                                                       1.08836
              1
                               0.14898
                                                       1.12789
                                                                         0.90731
    3
                   1
                               0.19753
                                                       1.18692
                                                                         0.11900
    4
              1
                               0.11723
                                                       0.85215
                    1
                                                                         0.88979
    5
              1
                   1
                               0.15040
                                                       1.20445
                                                                         0.09598
    6
              1
                               0.15466
                                                       0.95156
                                                                         0.31636
       ABC GAN MAE ABC_GAN MAE (skip connection)
    0
           0.03983
                                           0.04973
    1
           0.05588
                                           0.06058
    2
           0.07048
                                           0.05416
    3
           0.07974
                                           0.04311
    4
           0.09667
                                           0.08456
    5
           0.06731
                                           0.05081
           0.09388
                                           0.05459
                                      1.000000
    Variance
    Bias
                                      1.000000
    Prior Model MAE
                                      0.150399
    ABC pre-generator MAE
                                     1.127885
    Skip Node weight
                                     0.118999
    ABC GAN MAE
                                     0.070475
    ABC_GAN MAE (skip connection)
                                     0.054163
    dtype: float64
       Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight ackslash
    0
              1
                  0.1
                            0.08664
                                                       1.08078
                                                                         0.22811
```

0.07545

0.12254

1

1

0.1

```
2
         1 0.1
                          0.09482
                                                0.99885
                                                                  0.08496
3
         1 0.1
                          0.20895
                                                0.96605
                                                                  0.62171
4
         1 0.1
                          0.25964
                                                1.14851
                                                                  0.15538
5
         1 0.1
                          0.10261
                                                1.02987
                                                                  0.06901
6
                                                0.96000
         1 0.1
                          0.24933
                                                                  0.07279
  ABC GAN MAE ABC_GAN MAE (skip connection)
       0.06467
0
                                     0.05341
1
      0.09036
                                    0.08981
2
      0.08375
                                     0.05871
3
      0.08128
                                     0.11557
4
      0.11147
                                    0.12880
5
      0.05347
                                     0.05544
6
      0.14778
                                     0.15382
Variance
                                1.000000
Bias
                                0.100000
Prior Model MAE
                                0.122537
ABC pre-generator MAE
                              0.998852
Skip Node weight
                              0.084956
ABC GAN MAE
                               0.083755
ABC_GAN MAE (skip connection) 0.089808
dtype: float64
  Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight \
0
         1 0.01
                          0.10032
                                                1.04452
                                                                 0.07525
         1 0.01
1
                          0.15789
                                                0.95218
                                                                  0.86445
2
        1 0.01
                          0.06501
                                                0.99964
                                                                  0.19704
3
         1 0.01
                          0.10682
                                                                 0.75384
                                                0.98862
4
         1 0.01
                          0.14664
                                                1.01787
                                                                 0.07657
5
         1 0.01
                          0.14552
                                                0.97122
                                                                 0.30354
         1 0.01
                          0.10720
                                                0.99729
                                                                 0.06635
  ABC GAN MAE ABC_GAN MAE (skip connection)
0
      0.07946
                                    0.09370
1
      0.11203
                                    0.11231
2
                                    0.04880
      0.06338
3
      0.05058
                                    0.04444
4
      0.04879
                                    0.13630
5
                                    0.12470
      0.08534
6
      0.07713
                                    0.09104
Variance
                                1.000000
Bias
                                0.010000
Prior Model MAE
                                0.107199
ABC pre-generator MAE
                                0.997293
Skip Node weight
                                0.197037
ABC GAN MAE
                                0.077132
```

dtype: float64

| | Variance | Bias | Prior Model MAE | ABC pre-gen | nerator MAE | Skip Node weight | \ |
|--------|-------------|-------|-------------------|-------------|-------------|------------------|---|
| 0 | 0.1 | 1 | 0.10274 | | 0.60203 | 0.15046 | |
| 1 | 0.1 | 1 | 0.18400 | | 0.82051 | 0.18788 | |
| 2 | 0.1 | 1 | 0.13537 | | 0.64484 | 0.25334 | |
| 3 | 0.1 | 1 | 0.21186 | | 0.80396 | 0.53652 | |
| 4 | 0.1 | 1 | 0.22005 | | 0.76347 | 0.38458 | |
| 5 | 0.1 | 1 | 0.10358 | | 0.79639 | 0.12453 | |
| 6 | 0.1 | 1 | 0.19467 | | 0.89972 | 0.12335 | |
| | ABC GAN M | AE AB | C_GAN MAE (skip c | onnection) | | | |
| 0 | 0.077 | | C_GAN MAE (SKIP C | 0.06772 | | | |
| 1 | 0.076 | | | 0.00772 | | | |
| 2 | 0.062 | | | 0.04703 | | | |
| 3 | 0.002 | | | 0.07666 | | | |
| | 0.091 | | | 0.05504 | | | |
| 4 5 | | | | 0.05504 | | | |
| 6 | 0.047 | | | | | | |
| | 0.088 | 40 | | 0.07529 | | | |
| | ariance | | | 100000 | | | |
| Bi | ias | | | 000000 | | | |
| | rior Model | | | 184000 | | | |
| ΑE | BC pre-gene | rator | MAE O. | 796394 | | | |
| | kip Node we | ight | | 187885 | | | |
| ΑE | BC GAN MAE | | 0. | 077491 | | | |
| | | _ | connection) 0. | 067721 | | | |
| dt | type: float | 64 | | | | | |
| | | | | | | | |
| _ | Variance | | | ABC pre-ge | | Skip Node weight | \ |
| 0 | 0.1 | 0.1 | 0.14531 | | 0.21265 | 0.08516 | |
| 1 | 0.1 | 0.1 | 0.19443 | | 0.26237 | 0.24546 | |
| 2 | 0.1 | 0.1 | 0.19176 | | 0.22195 | 0.07296 | |
| 3 | 0.1 | 0.1 | 0.18345 | | 0.29532 | 0.04840 | |
| 4 | 0.1 | 0.1 | 0.10016 | | 0.17115 | 0.49182 | |
| 5 | 0.1 | 0.1 | 0.16224 | | 0.18113 | 0.05279 | |
| 6 | 0.1 | 0.1 | 0.09559 | | 0.17334 | 0.38276 | |
| | ABC GAN M | AE AB | C_GAN MAE (skip c | onnection) | | | |
| 0 | 0.094 | 33 | | 0.09047 | | | |
| 1 | 0.088 | 17 | | 0.11063 | | | |
| 2 | 0.059 | | | 0.08006 | | | |
| 3 | 0.066 | | | 0.10326 | | | |
| 4 | 0.075 | | | 0.06508 | | | |
| 5 | 0.054 | | | 0.06656 | | | |
| 6 | 0.082 | | | 0.07818 | | | |
| | | | | | | | |

| Variance Bias Prior Model MA ABC pre-genera Skip Node weig ABC GAN MAE ABC_GAN MAE (s dtype: float64 | tor MAE ht skip connection | 0.1000 0.1000 0.1622 0.2126 0.0853 0.0755 0.0800 | 000 240 655 163 793 | | |
|---|----------------------------------|--|--|--|---|
| Variance E | Bias Prior Mod | el MAE ABO | C pre-generator MAE | Skip Node weight | \ |
| 0 0.1 0 | 0.01 0 | .14108 | 0.20592 | 0.58303 | |
| 1 0.1 0 | 0.01 | . 14328 | 0.18772 | 0.32514 | |
| 2 0.1 0 | 0.01 | . 12463 | 0.14043 | 0.03141 | |
| 3 0.1 0 | 0.01 | . 16789 | 0.18361 | 0.19254 | |
| 4 0.1 0 | 0.01 | .06525 | 0.11418 | 0.03785 | |
| 5 0.1 0 | 0.01 | . 11773 | 0.14043 | 0.52496 | |
| 6 0.1 0 | 0.01 | . 11736 | 0.15207 | 0.03082 | |
| 0 0.09983 1 0.08184 2 0.10935 3 0.12760 4 0.05233 5 0.11588 6 0.09748 Variance Bias Prior Model MA ABC pre-genera Skip Node weig ABC GAN MAE | LE Ltor MAE Ship connection | 0.1000 0.0100 0.1246 0.1520 0.1928 0.0998 | 0.14749 0.12781 0.13028 0.16063 0.06712 0.10306 0.11824 000 000 527 072 537 | | |
| Variance E 0 0.01 1 0.01 2 0.01 3 0.01 4 0.01 5 0.01 6 0.01 | 1 0 1 0 1 0 1 0 1 0 | el MAE ABO .14403 .11802 .15333 .13681 .15148 .16064 .11206 | C pre-generator MAE 0.74114 0.82910 0.63561 1.03887 0.75239 0.86782 0.84647 | Skip Node weight 0.72776 0.47447 0.87911 0.64891 0.89693 0.10019 0.18724 | \ |

ABC GAN MAE ABC_GAN MAE (skip connection)
0 0.07486 0.07345

```
1
      0.05623
                                0.04519
2
     0.09225
                                0.06239
3
     0.05432
                                0.04067
4
     0.06319
                                0.05484
5
     0.08251
                                0.06306
6
     0.05780
                                0.05984
                           0.010000
Variance
Bias
                           1.000000
Prior Model MAE
                           0.144034
ABC pre-generator MAE
                          0.829097
Skip Node weight
                           0.648910
ABC GAN MAE
                           0.063192
ABC_GAN MAE (skip connection) 0.059837
dtype: float64
_____
  Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight \
0
     0.01 0.1
                      0.08611
                                          0.10014
                                                         0.11448
1
     0.01 0.1
                     0.14182
                                         0.16452
                                                        0.38924
     0.01 0.1
2
                     0.08366
                                         0.13291
                                                        0.85842
     0.01 0.1
3
                     0.15718
                                         0.19995
                                                        0.58195
                    0.08675
    0.01 0.1
4
                                         0.14506
                                                        0.03570
                     0.14809
5
     0.01 0.1
                                        0.15994
                                                        0.15341
6
     0.01 0.1
                     0.17979
                                        0.24141
                                                        0.09049
  ABC GAN MAE ABC_GAN MAE (skip connection)
0
     0.03919
                                0.04223
1
      0.07521
                                0.08046
2
     0.06312
                                0.03845
3
     0.09116
                                0.09086
4
                                0.04430
     0.04680
5
     0.08700
                                0.08208
6
     0.09387
                                0.06309
Variance
                           0.010000
Bias
                           0.100000
Prior Model MAE
                           0.141818
ABC pre-generator MAE
                          0.159936
Skip Node weight
                           0.153409
ABC GAN MAE
                           0.075211
ABC_GAN MAE (skip connection) 0.063094
dtype: float64
-----
  Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight \
      0.01 0.01
0
                     0.19134
                                          0.18994
                                                         0.00039
1
     0.01 0.01
                     0.23222
                                         0.23572
                                                         0.01917
                    0.15958
2
     0.01 0.01
                                        0.16099
                                                        0.65389
3
     0.01 0.01
                     0.07425
                                         0.07819
                                                         0.01657
```

```
4
           0.01 0.01
                                0.19488
                                                       0.19595
                                                                         0.00000
    5
           0.01 0.01
                                0.13120
                                                       0.13433
                                                                         0.01152
    6
           0.01 0.01
                               0.11860
                                                       0.12004
                                                                         0.06184
       ABC GAN MAE ABC GAN MAE (skip connection)
    0
           0.11355
                                           0.19216
    1
           0.15256
                                           0.22942
    2
           0.12704
                                           0.14181
    3
           0.05087
                                           0.06998
    4
           0.10992
                                           0.19472
    5
                                           0.13048
           0.10145
    6
           0.08086
                                           0.12044
                                      0.010000
    Variance
    Bias
                                      0.010000
    Prior Model MAE
                                      0.159576
    ABC pre-generator MAE
                                      0.160987
    Skip Node weight
                                      0.016569
    ABC GAN MAE
                                      0.109923
    ABC_GAN MAE (skip connection)
                                     0.141806
    dtype: float64
[7]: # Display Cathoost Summary Tables
     data = np.array(data)
     catboostData = []
     for i in range(9):
         catboostData.append([paramVal[i][0],__
      →paramVal[i][1],catboost,median(data[i][:,3]),median(data[i][:
     \rightarrow,5]),median(data[i][:,6]),median(data[i][:,4])])
     df = pd.DataFrame(catboostData, columns = ['Variance', 'Bias', 'Catboost', 'Prior_
      →Model MAE', 'mGAN', 'skipGAN', 'Skip Node weight'])
     display(df.round(5))
                       Catboost Prior Model MAE
                                                            skipGAN \
       Variance
                 Bias
                                                      mGAN
    0
           1.00 1.00
                        0.03605
                                          1.12789 0.07048 0.05416
    1
           1.00
                 0.10
                        0.03605
                                          0.99885 0.08375 0.08981
    2
           1.00 0.01
                        0.03605
                                          0.99729 0.07713 0.09370
    3
           0.10 1.00
                        0.03605
                                          0.79639 0.07749 0.06772
    4
           0.10 0.10
                        0.03605
                                          0.21265 0.07579 0.08006
    5
           0.10 0.01
                        0.03605
                                          0.15207 0.09983 0.12781
    6
           0.01 1.00
                                          0.82910 0.06319 0.05984
                        0.03605
    7
           0.01 0.10
                        0.03605
                                          0.15994 0.07521 0.06309
           0.01 0.01
                        0.03605
                                          0.16099 0.10992 0.14181
       Skip Node weight
    0
                0.11900
                0.08496
    1
```

```
2 0.19704
3 0.18788
4 0.08516
5 0.19254
6 0.64891
7 0.15341
8 0.01657
```

3.2 ABC Pre-generator - Stats

```
[8]: book = sb.read_notebooks("./ABC_GAN_Stats")
     paramVal = [[1,1],[0.1,1],[0.01,1],[1,0.1],[0.1,0.1],[0.01,0.1],[1,0.01],[0.1,0.1]
     \hookrightarrow01],[0.01,0.01]]
     abc mae = [[] for i in range(9)]
     abc_mae_skip = [[] for i in range(9)]
     abc_mae_mean = [[] for i in range(9)]
     abc_mae_skip_mean = [[] for i in range(9)]
     abc_weights = [[] for i in range(9)]
     prior_model = [[] for i in range(9)]
     abc_pre_generator = [[] for i in range(9)]
     for nb in book.notebooks:
         metrics1 = np.array(nb.scraps['ABC GAN 1 Metrics'].data)
         metrics3 = np.array(nb.scraps['ABC_GAN_3 Metrics'].data)
         paramVar = float(nb.papermill dataframe.iloc[0]['value'])
         paramBias = float(nb.papermill_dataframe.iloc[1]['value'])
         #Divide data according to parameters
         for i in range(9):
             if paramVar == paramVal[i][0] and paramBias == paramVal[i][1]:
                 for j in range(100):
                     abc_mae[i].append(metrics1[1,j])
                     abc_mae_skip[i].append(metrics3[1,j])
                 abc_weights[i].append(nb.scraps['Skip Connection Weight'].data)
                 prior_model[i].append(nb.scraps['Prior Model MSE'].data)
                 abc_pre_generator[i].append(nb.scraps['ABC Pre-generator MSE'].data)
                 abc_mae_skip_mean[i].append(mean(metrics3[1,:]))
                 abc_mae_mean[i].append(mean(metrics1[1,:]))
```

```
'ABC pre-generator MAE', 'Skip Node_
 →weight', 'ABC GAN MAE', 'ABC_GAN MAE (skip connection)'])
    display(df.round(5))
    print(df.median(axis=0))
    print("----")
  Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight
0
               1
                          0.23813
                                                 1.28106
                                                                   0.80094
1
                          0.22102
                                                 1.14056
                                                                   0.99307
2
                          0.27459
                                                 1.08816
                                                                   0.98481
         1
               1
3
         1
              1
                          0.28813
                                                 1.31808
                                                                   0.83078
4
         1
              1
                          0.34480
                                                 1.12133
                                                                   0.91197
5
         1
              1
                          0.24110
                                                 1.03853
                                                                   0.89858
6
         1
              1
                          0.33800
                                                 1.08370
                                                                   0.85938
7
         1
              1
                          0.33133
                                                 1.30251
                                                                   0.87432
8
                          0.27649
                                                 1.56975
                                                                  0.86954
9
                          0.24126
                                                 1.44175
                                                                  0.84671
  ABC GAN MAE ABC_GAN MAE (skip connection)
0
      0.05578
                                     0.03611
      0.08598
                                     0.04595
1
2
      0.07290
                                     0.05594
3
      0.08666
                                     0.05056
4
      0.10008
                                     0.06026
5
      0.06163
                                     0.06707
6
      0.10560
                                     0.07152
7
      0.09254
                                     0.05680
8
      0.08778
                                     0.05912
      0.10785
                                     0.06424
Variance
                                1.000000
Bias
                                1.000000
Prior Model MAE
                                0.275544
ABC pre-generator MAE
                               1.210808
Skip Node weight
                                0.871929
ABC GAN MAE
                                0.087218
ABC_GAN MAE (skip connection)
                                0.057961
dtype: float64
   Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight
0
       0.1
                                                                   0.80055
              1
                          0.25161
                                                 1.00356
       0.1
1
               1
                          0.23106
                                                 0.97778
                                                                   0.94645
2
       0.1
               1
                          0.19174
                                                 0.85203
                                                                   0.90555
       0.1
3
                          0.32052
                                                                   0.84012
                                                 0.85877
4
       0.1
                          0.35152
                                                 1.15790
                                                                   0.96313
5
       0.1
                          0.26972
                                                 0.88087
                                                                   0.89831
       0.1
                                                 1.01589
6
                          0.22885
                                                                  0.92057
7
       0.1
               1
                          0.24305
                                                 0.72427
                                                                   0.97428
```

```
8
        0.1
             1
                           0.29900
                                                  0.72984
                                                                     0.88633
9
        0.1
                           0.25311
                                                  0.99157
                                                                     0.83004
                1
   ABC GAN MAE ABC_GAN MAE (skip connection)
       0.10176
                                      0.07265
0
1
       0.08995
                                      0.06388
2
       0.06332
                                      0.05827
3
       0.09127
                                      0.05755
4
       0.12788
                                      0.07187
5
       0.15212
                                      0.04405
6
      0.13595
                                      0.06548
7
      0.05745
                                      0.04699
8
       0.07252
                                      0.06855
9
      0.07409
                                      0.06332
                                 0.100000
Variance
Bias
                                 1.000000
Prior Model MAE
                                 0.252361
ABC pre-generator MAE
                                 0.929323
Skip Node weight
                                 0.901929
ABC GAN MAE
                                 0.090611
ABC_GAN MAE (skip connection) 0.063601
dtype: float64
   Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight \
0
       0.01
                1
                           0.32042
                                                  1.04047
                                                                    0.81824
       0.01
1
                1
                           0.28806
                                                  0.95742
                                                                     0.83305
2
       0.01
                1
                           0.29300
                                                  0.82354
                                                                     0.83751
3
      0.01
                                                                     0.99301
                1
                           0.26589
                                                  0.70296
4
      0.01
              1
                           0.34727
                                                  0.83058
                                                                    0.94527
5
      0.01
                           0.28665
                                                  0.94167
                                                                    0.85447
              1
6
      0.01
              1
                           0.19762
                                                  0.93788
                                                                    0.85314
7
      0.01
              1
                           0.33222
                                                  0.96593
                                                                    0.90723
8
       0.01
                1
                           0.31160
                                                  0.93358
                                                                    0.90637
9
       0.01
                           0.26259
                                                                    0.90015
                1
                                                  1.09724
  ABC GAN MAE ABC_GAN MAE (skip connection)
0
       0.15056
                                      0.05376
1
       0.09888
                                      0.06393
2
       0.09255
                                      0.05515
3
       0.08804
                                      0.07910
4
       0.11802
                                      0.11185
5
       0.13636
                                      0.12575
6
       0.08796
                                      0.05882
7
       0.17413
                                      0.06964
8
       0.04920
                                      0.04424
9
       0.11388
                                      0.05591
```

```
Variance
                            0.010000
Bias
                            1.000000
Prior Model MAE
                            0.290531
ABC pre-generator MAE
                           0.939773
Skip Node weight
                           0.877308
ABC GAN MAE
                           0.106381
ABC_GAN MAE (skip connection) 0.061378
dtype: float64
_____
  Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight \
0
        1 0.1
                       0.15848
                                          1.02515
                                                         0.35960
1
       1 0.1
                      0.28747
                                          1.03234
                                                         0.48291
2
       1 0.1
                      0.38027
                                          0.95697
                                                         0.41503
3
       1 0.1
                     0.27555
                                          1.03413
                                                         0.36314
4
       1 0.1
                     0.26304
                                          0.94752
                                                         0.40510
5
       1 0.1
                     0.16404
                                          1.03105
                                                         0.45740
6
       1 0.1
                     0.25512
                                         0.88285
                                                         0.39486
7
       1 0.1
                     0.27934
                                          0.84238
                                                         0.33649
8
       1 0.1
                     0.34714
                                         0.94914
                                                         0.37754
9
        1 0.1
                       0.30716
                                        0.93222
                                                         0.56371
  ABC GAN MAE ABC_GAN MAE (skip connection)
0
     0.09791
                                0.05751
1
     0.05833
                                0.05602
2
     0.14355
                                0.03443
3
     0.16415
                                0.03652
4
     0.09546
                                0.06707
5
     0.04868
                                0.04967
6
     0.07134
                                0.04868
7
     0.09671
                                0.09255
8
     0.16875
                                0.05799
9
     0.07879
                                0.04365
Variance
                            1.000000
Bias
                            0.100000
Prior Model MAE
                            0.277444
ABC pre-generator MAE
                          0.953058
Skip Node weight
                           0.399979
ABC GAN MAE
                           0.096082
ABC_GAN MAE (skip connection) 0.052843
dtype: float64
_____
                                                                 \
```

| | Variance | Bias | Prior Model MAE | ABC pre-generator MAE | Skip Node weight | ١ |
|---|----------|------|-----------------|-----------------------|------------------|---|
| 0 | 0.1 | 0.1 | 0.37586 | 0.42114 | 0.21063 | |
| 1 | 0.1 | 0.1 | 0.39242 | 0.39813 | 0.27957 | |
| 2 | 0.1 | 0.1 | 0.26563 | 0.26669 | 0.22720 | |
| 3 | 0.1 | 0.1 | 0.22658 | 0.23648 | 0.24648 | |

| | | | 0.05400 | | 0.05400 |
|---|--------------------------------------|--|--|---|---|
| 4 | 0.1 | 0.1 | 0.25406 | 0.26922 | 0.25468 |
| 5 | 0.1 | 0.1 | 0.42598 | 0.44634 | 0.17733 |
| 6 | 0.1 | 0.1 | 0.31496 | 0.37584 | |
| 7 | 0.1 | 0.1 | 0.35132 | 0.39539 | |
| 8 | 0.1 | 0.1 | 0.32082 | 0.32711 | 0.23721 |
| 9 | 0.1 | 0.1 | 0.24014 | 0.31500 | 0.26480 |
| A . | DO GAN M | 4E 4DG | CAN MAD () : | | |
| _ | | _ | _GAN MAE (skip connec | | |
| 0 | 0.0588 | | | 06852 | |
| 1 | 0.104 | | | 07413 | |
| 2 | 0.1378 | | | 05510 | |
| 3 | 0.074 | 50 | 0. | 02703 | |
| 4 | 0.066 | 54 | 0. | 02957 | |
| 5 | 0.113 | 75 | 0. | 06301 | |
| 6 | 0.1340 | 00 | 0. | 07093 | |
| 7 | 0.198 | 19 | 0. | 04794 | |
| 8 | 0.111 | 79 | 0. | 04555 | |
| 9 | 0.126 | 67 | 0. | 05867 | |
| Vari | ance | | 0.10000 | 0 | |
| Bias | | | 0.10000 | 0 | |
| Prio | r Model 1 | MAE | 0.31788 | 7 | |
| ABC | pre-gene | rator MA | AE 0.35147 | 3 | |
| | Node we: | | 0.24184 | | |
| _ | GAN MAE | O | 0.11277 | | |
| | | | | | |
| ABC | GAN MAE | (skip co | onnection) 0.05688 | 3 | |
| | GAN MAE e: floate | _ | onnection) 0.05688 | 3 | |
| | | 64 | onnection) 0.05688 | | |
| dtyp | e: floate | 64 | | | Skip Node weight \ |
| dtyp | e: float(ariance | 64 | | | - |
| dtyp | e: floate | 64 Bias I | Prior Model MAE ABC | pre-generator MAE | 0.24639 |
| dtyp V | e: float6 ariance 0.01 0.01 | Bias F 0.1 0.1 | Prior Model MAE ABC : 0.30467 0.22587 | pre-generator MAE 0.28774 0.21911 | 0.24639 0.21452 |
| dtyp V 0 1 2 | e: float6 | Bias F 0.1 0.1 0.1 | Prior Model MAE ABC : 0.30467 | pre-generator MAE 0.28774 0.21911 0.30247 | 0.24639 0.21452 0.20897 |
| dtyp V 0 1 2 3 | e: floate | Bias F 0.1 0.1 0.1 0.1 | Prior Model MAE ABC : 0.30467 | pre-generator MAE 0.28774 0.21911 0.30247 0.27567 | 0.24639 0.21452 0.20897 0.22110 |
| dtyp V 0 1 2 3 4 | e: floate | Bias I 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 | pre-generator MAE 0.28774 0.21911 0.30247 0.27567 0.30339 | 0.24639 0.21452 0.20897 0.22110 0.19463 |
| dtyp V 0 1 2 3 4 5 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 | pre-generator MAE 0.28774 0.21911 0.30247 0.27567 0.30339 0.21351 | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 |
| dtyp 0 1 2 3 4 5 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 | pre-generator MAE 0.28774 0.21911 0.30247 0.27567 0.30339 0.21351 0.24400 | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 |
| dtyp V 0 1 2 3 4 5 6 7 | e: floate | Bias I 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 | pre-generator MAE 0.28774 0.21911 0.30247 0.27567 0.30339 0.21351 0.24400 0.21720 | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 |
| dtyp 0 1 2 3 4 5 6 7 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 | pre-generator MAE 0.28774 0.21911 0.30247 0.27567 0.30339 0.21351 0.24400 0.21720 0.30607 | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |
| dtyp V 0 1 2 3 4 5 6 7 | e: floate | Bias I 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 | pre-generator MAE 0.28774 0.21911 0.30247 0.27567 0.30339 0.21351 0.24400 0.21720 | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 |
| dtyp 0 1 2 3 4 5 6 7 8 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 | pre-generator MAE | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |
| dtyp 0 1 2 3 4 5 6 7 8 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 0.22632 GAN MAE (skip connections) | pre-generator MAE | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |
| dtyp V 0 1 2 3 4 5 6 7 8 9 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 0.22632 GAN MAE (skip connections) | pre-generator MAE | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |
| dtyp V 0 1 2 3 4 5 6 7 8 9 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 0.22632 GAN MAE (skip connections) | pre-generator MAE | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |
| dtyp V 0 1 2 3 4 5 6 7 8 9 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 0.22632 GAN MAE (skip connections) | pre-generator MAE | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |
| dtyp V 0 1 2 3 4 5 6 7 8 9 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 0.22632 GAN MAE (skip connections) | pre-generator MAE | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |
| dtyp V 0 1 2 3 4 5 6 7 8 9 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 0.22632 GAN MAE (skip connections) 0.0000000000000000000000000000000000 | pre-generator MAE | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |
| dtyp 0 1 2 3 4 5 6 7 8 9 | e: floate | Bias F 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 0.1 | Prior Model MAE ABC: 0.30467 0.22587 0.27178 0.30021 0.29109 0.20596 0.21403 0.20590 0.24217 0.22632 GAN MAE (skip connection of the connection o | pre-generator MAE | 0.24639 0.21452 0.20897 0.22110 0.19463 0.14792 0.22088 0.14589 0.19146 |

```
7
      0.18608
                                 0.04297
      0.07680
8
                                 0.06166
9
     0.08007
                                 0.04421
Variance
                            0.010000
Bias
                            0.100000
Prior Model MAE
                            0.234245
ABC pre-generator MAE
                           0.262001
Skip Node weight
                           0.211749
ABC GAN MAE
                            0.078435
ABC_GAN MAE (skip connection) 0.044621
dtype: float64
_____
  Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight \
0
        1 0.01
                       0.36826
                                           0.91115
                                                           0.28229
1
       1 0.01
                     0.34647
                                           1.16487
                                                           0.41372
2
       1 0.01
                      0.43305
                                           0.82060
                                                           0.30517
3
       1 0.01
                     0.25925
                                                           0.29223
                                           1.12263
4
       1 0.01
                     0.26498
                                           0.99650
                                                          0.35846
       1 0.01
5
                     0.33890
                                          1.12079
                                                          0.31348
6
       1 0.01
                      0.40582
                                          1.08497
                                                          0.29170
7
       1 0.01
                     0.28917
                                          0.97165
                                                          0.30808
       1 0.01
8
                     0.27076
                                          0.95222
                                                          0.35593
9
        1 0.01
                       0.28392
                                           0.99834
                                                          0.31930
  ABC GAN MAE ABC_GAN MAE (skip connection)
0
     0.07102
                                 0.12064
1
      0.06715
                                 0.08955
2
      0.09859
                                 0.06751
3
     0.10683
                                 0.03557
4
                                 0.04818
     0.06766
5
     0.14320
                                 0.06844
6
     0.11948
                                 0.04632
7
                                 0.05320
     0.05702
8
     0.10192
                                 0.04222
9
     0.15118
                                 0.07821
Variance
                            1.000000
Bias
                            0.010000
Prior Model MAE
                            0.314033
ABC pre-generator MAE
                            0.997419
                            0.310780
Skip Node weight
ABC GAN MAE
                            0.100257
ABC_GAN MAE (skip connection) 0.060356
dtype: float64
_____
  Variance Bias Prior Model MAE ABC pre-generator MAE Skip Node weight \
```

0.18846

0.1 0.01 0.29040

| 1 | 0.1 0.01 | 0.20689 | | 0.22834 | 0.12998 | |
|--------|---------------------------------------|-----------------|-----------------------|---------|------------------|---|
| 2 | 0.1 0.01 | 0.22965 | | 0.27914 | 0.20615 | |
| 3 | 0.1 0.01 | 0.26198 | | 0.30295 | 0.30962 | |
| 4 | 0.1 0.01 | 0.24439 | | 0.26979 | 0.17537 | |
| 5 | 0.1 0.01 | 0.30451 | | 0.33510 | 0.21017 | |
| 6 | 0.1 0.01 | 0.17371 | | 0.17706 | 0.13925 | |
| 7 | 0.1 0.01 | 0.27235 | | 0.29969 | 0.14823 | |
| 8 | 0.1 0.01 | 0.25453 | | 0.26400 | 0.16646 | |
| 9 | 0.1 0.01 | 0.25111 | | 0.25722 | 0.10377 | |
| А | BC GAN MAE ABC_ | GAN MAE (skip c | onnection) | | | |
| 0 | 0.18791 | (2p 0 | 105.53128 | | | |
| 1 | 0.09103 | | 0.05241 | | | |
| 2 | 0.09168 | | 0.03241 | | | |
| 3 | 0.12064 | | 0.11256 | | | |
| 4 | | | 0.11230 | | | |
| 5 | 0.07644 | | | | | |
| | 0.11085 | | 0.05231 | | | |
| 6 | 0.08194 | | 0.05806 | | | |
| 7 | 0.08227 | | 0.07366 | | | |
| 8 | 0.04820 | | 0.03724 | | | |
| 9 | 0.13528 | | 43.47140 | | | |
| Vari | ance | 0. | 100000 | | | |
| Bias | ; | 0. | 010000 | | | |
| Prio | r Model MAE | 0. | 252820 | | | |
| ABC | pre-generator MA | E 0. | 274466 | | | |
| Skip | Node weight | 0. | 170914 | | | |
| ABC | GAN MAE | 0. | 091859 | | | |
| ABC_ | GAN MAE (skip co | nnection) 0. | 065858 | | | |
| dtyp | e: float64 | | | | | |
| | · · · · · · · · · · · · · · · · · · · | | ADG | . мап | | , |
| _ | | | | | Skip Node weight | \ |
| 0 | 0.01 0.01 | | | | 0.15135 | |
| 1 | 0.01 0.01 | 0.33105 | | 0.33298 | 0.12219 | |
| 2 | 0.01 0.01 | 0.25052 | | 0.25091 | 0.20049 | |
| 3 | 0.01 0.01 | 0.24286 | | 0.24847 | 0.16389 | |
| 4 | 0.01 0.01 | 0.26252 | | 0.26526 | 0.29397 | |
| 5 | 0.01 0.01 | 0.31213 | | 0.31339 | 0.24219 | |
| 6 | 0.01 0.01 | 0.20266 | | 0.20573 | 0.17417 | |
| 7 | 0.01 0.01 | 0.26714 | | 0.26767 | 0.11562 | |
| 8 | 0.01 0.01 | 0.38525 | | 0.37973 | 0.15593 | |
| 9 | 0.01 0.01 | 0.38200 | | 0.38359 | 0.20646 | |
| | | | | | | |
| A | BC GAN MAE ABC_ | GAN MAE (skip c | onnection) | | | |
| A O | BC GAN MAE ABC_ 0.21197 | GAN MAE (skip c | onnection) 0.09347 | | | |
| 0 | 0.21197 | GAN MAE (skip c | 0.09347 | | | |
| 0 1 | 0.21197 0.08594 | GAN MAE (skip c | 0.09347 0.09629 | | | |
| 0 | 0.21197 | GAN MAE (skip c | 0.09347 | | | |

```
5
            0.08427
                                           0.08858
     6
            0.10652
                                           0.05460
     7
            0.09334
                                           0.04925
     8
            0.10218
                                           0.10349
     9
            0.12734
                                           0.10027
                                      0.010000
     Variance
     Bias
                                      0.010000
     Prior Model MAE
                                      0.272074
     ABC pre-generator MAE
                                      0.271841
     Skip Node weight
                                      0.169029
     ABC GAN MAE
                                      0.107284
     ABC_GAN MAE (skip connection)
                                      0.091025
     dtype: float64
[10]: # Display Stats Summary Tables
      data = np.array(data)
      catboostData = []
      for i in range(9):
          catboostData.append([paramVal[i][0], paramVal[i][1],stats,median(data[i][:
      \rightarrow,3]),median(data[i][:,5]),median(data[i][:,6]),median(data[i][:,4])])
      df = pd.DataFrame(catboostData, columns = ['Variance', 'Bias', 'Stats', 'Prior___
      →Model MAE', 'mGAN', 'skipGAN', 'Skip Node weight'])
      display(df.round(5))
        Variance Bias
                          Stats Prior Model MAE
                                                     mGAN skipGAN \
     0
            1.00 1.00 0.26665
                                         1.21081 0.08722 0.05796
            0.10 1.00 0.26665
                                         0.92932 0.09061 0.06360
     1
     2
            0.01 1.00 0.26665
                                         0.93977 0.10638 0.06138
     3
            1.00 0.10 0.26665
                                         0.95306 0.09608 0.05284
     4
            0.10
                  0.10 0.26665
                                         0.35147 0.11277 0.05688
     5
            0.01 0.10 0.26665
                                         0.26200 0.07843 0.04462
            1.00 0.01 0.26665
     6
                                         0.99742 0.10026 0.06036
     7
            0.10 0.01 0.26665
                                         0.27447 0.09186 0.06586
     8
            0.01 0.01 0.26665
                                         0.27184 0.10728 0.09103
        Skip Node weight
     0
                 0.87193
     1
                 0.90193
     2
                 0.87731
     3
                 0.39998
     4
                 0.24184
     5
                 0.21175
     6
                 0.31078
     7
                 0.17091
                 0.16903
     8
```

4

0.10805