

DV Seminar 3

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In [1]: import numpy as np, pandas as pd, matplotlib.pyplot as plt
c:\Users\Stefan\AppData\Local\Programs\Python\Python310\lib\site-packages\matplotlib\projections\_init__.py:63: UserWarning: Unable to import Axes3D. This may be due to multiple versions of Matplotlib being installed (e.g. as a system package and as a pip package). As a result, the 3D projection is not available.
warnings.warn("Unable to import Axes3D. This may be due to multiple versions of "
In [2]: results = pd.read_csv('results.csv')
In [3]: results.sample(5)
Out[3]:
   id_alg  param_1  param_2  param_3  id_dataset  param_4  mean_ind  std_ind  ind_0  ind_1  ind_2  ind_3  ind_4  ind_5  ind_6  ind_7  i
0    482    OBLQ_1      -1       -      5         1       1.0  0.920000  0.060000  1.000000  0.900000  0.900000  0.900000  0.900000  0.900000  1.000000  1.000000  0.80
1     131        12       10       1       5         3       60  0.796515  0.076436  0.854545  0.759091  0.668182  0.709091  0.909091  0.763636  0.809091  0.861111  0.86
2     160         5        5       0       0         3       3  0.747399  0.112302  0.854545  0.750000  0.713636  0.904545  0.759091  0.854545  0.522727  0.680556  0.61
3     185         6       10       0       0         4       60  0.994252  0.006452  1.000000  1.000000  0.985224  1.000000  0.986842  0.983607  1.000000  1.000000  0.95
4     408         1      -1       0       5         7       4  0.762500  0.083437  0.733333  0.816667  0.591667  0.858333  0.800000  0.808333  0.841667  0.700000  0.65
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In [4]: algo_ids = list(sorted(set(results['id_alg'].values)))
print(algo_ids)
['1', '10', '11', '12', '2', '3', '4', '5', '6', '7', '8', '9', 'OBLQ_1', 'OBLQ_2']
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In [5]: dataset_ids = list(sorted(set(results['id_dataset'].values)))
print(dataset_ids)
[1, 2, 3, 4, 5, 6, 7, 8]
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In [6]: results.groupby('id_alg').describe()
Out[6]:
param_1                                     param_3 ... ind_8           ind_9
count  mean  std  min  25%  50%  75%  max  count  mean  ... 75%  max  count  mean  std  min  25%  50%  75%  max
id_alg
1    40.0  -1.0  0.0  -1.0  -1.0  -1.0  -1.0  40.0  40.0  5.0  ... 0.975814  1.0  40.0  0.789516  0.167548  0.312500  0.685985  0.816550  0.916230  1.0
10   40.0   10.0  0.0  10.0  10.0  10.0  10.0  40.0  40.0  5.0  ... 0.976219  1.0  40.0  0.845433  0.152475  0.333333  0.724936  0.860111  0.988487  1.0
11   40.0    5.0  0.0  5.0  5.0  5.0  5.0  40.0  40.0  5.0  ... 0.967564  1.0  40.0  0.820050  0.161333  0.416667  0.695644  0.866667  0.971689  1.0
12   40.0   10.0  0.0  10.0  10.0  10.0  10.0  40.0  40.0  5.0  ... 0.977028  1.0  40.0  0.839014  0.141028  0.458333  0.714583  0.854215  0.986842  1.0
2    40.0   -1.0  0.0  -1.0  -1.0  -1.0  -1.0  40.0  40.0  5.0  ... 0.973738  1.0  40.0  0.818730  0.165192  0.312500  0.705303  0.812383  0.992208  1.0
3    40.0   -1.0  0.0  -1.0  -1.0  -1.0  -1.0  40.0  40.0  10.0  ... 0.986869  1.0  40.0  0.808657  0.160890  0.479167  0.694409  0.847917  0.966220  1.0
4    40.0   -1.0  0.0  -1.0  -1.0  -1.0  -1.0  40.0  40.0  10.0  ... 0.970449  1.0  40.0  0.811330  0.163811  0.416667  0.690673  0.820251  0.995066  1.0
5    40.0    5.0  0.0  5.0  5.0  5.0  5.0  40.0  40.0  0.0  ... 0.981935  1.0  40.0  0.831280  0.164435  0.312500  0.685433  0.872611  1.000000  1.0
6    40.0   10.0  0.0  10.0  10.0  10.0  10.0  40.0  40.0  0.0  ... 0.986060  1.0  40.0  0.837082  0.146068  0.500000  0.699423  0.856250  0.992208  1.0
7    40.0    5.0  0.0  5.0  5.0  5.0  5.0  40.0  40.0  0.0  ... 0.992208  1.0  40.0  0.808419  0.182123  0.291667  0.683144  0.872145  0.985224  1.0
8    40.0   10.0  0.0  10.0  10.0  10.0  10.0  40.0  40.0  0.0  ... 0.982339  1.0  40.0  0.840062  0.145364  0.479167  0.747727  0.858586  0.981557  1.0
9    40.0    5.0  0.0  5.0  5.0  5.0  5.0  40.0  40.0  5.0  ... 0.948365  1.0  40.0  0.829635  0.158177  0.458333  0.710000  0.847601  0.988082  1.0
OBLQ_1  40.0   -1.0  0.0  -1.0  -1.0  -1.0  -1.0  40.0  40.0  5.0  ... 0.988082  1.0  40.0  0.803827  0.172445  0.447917  0.672500  0.835664  1.000000  1.0
OBLQ_2  40.0   -1.0  0.0  -1.0  -1.0  -1.0  -1.0  40.0  40.0  10.0  ... 0.988082  1.0  40.0  0.803827  0.172445  0.447917  0.672500  0.835664  1.000000  1.0
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14 rows × 128 columns

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In [7]: algos = {}
for id_alg in algo_ids:
    algos[id_alg] = results.query(f'id_alg=="{id_alg}"')[['ind_'+str(i) for i in range(10)]]
algos[id_alg].head(1)
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Out[7]:
   ind_0  ind_1  ind_2  ind_3  ind_4  ind_5  ind_6  ind_7  ind_8  ind_9
481  0.8    0.9    0.8    1.0   1.0   0.8    0.9    0.9    1.0   1.0
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In [9]: from autorank import autorank, plot_stats, create_report
data = {id_alg:d['ind_0'].values for id_alg, d in algos.items()}

df = pd.DataFrame(data)
result = autorank(df, alpha=0.05, verbose=True)
plot_stats(result)

report = create_report(result)
print(report)

Fail to reject null hypothesis that data is normal for column 1 (p=0.005032>=0.003571)
Rejecting null hypothesis that data is normal for column 10 (p=0.001629<0.003571)
Rejecting null hypothesis that data is normal for column 11 (p=0.001985<0.003571)
Rejecting null hypothesis that data is normal for column 12 (p=0.000893<0.003571)
Fail to reject null hypothesis that data is normal for column 2 (p=0.009421>=0.003571)
Rejecting null hypothesis that data is normal for column 3 (p=0.002375<0.003571)
Fail to reject null hypothesis that data is normal for column 4 (p=0.008135>=0.003571)
Rejecting null hypothesis that data is normal for column 5 (p=0.000361<0.003571)
Rejecting null hypothesis that data is normal for column 6 (p=0.000843<0.003571)
Fail to reject null hypothesis that data is normal for column 7 (p=0.014942>=0.003571)
Rejecting null hypothesis that data is normal for column 8 (p=0.001126<0.003571)
Rejecting null hypothesis that data is normal for column 9 (p=0.001083<0.003571)
Fail to reject null hypothesis that data is normal for column OBLQ_1 (p=0.004042>=0.003571)
Fail to reject null hypothesis that data is normal for column OBLQ_2 (p=0.004042>=0.003571)
Using Levene's test for homoscedacity of non-normal data.
Fail to reject null hypothesis that all variances are equal (p=0.985669>=0.050000)
Using Friedman test as omnibus test
Rejecting null hypothesis that there is no difference between the distributions (p=0.002933)
Using Nemenyi post-hoc test. Differences are significant, if the distance between the mean ranks is greater than the critical distance.
The statistical analysis was conducted for 14 populations with 40 paired samples.
The family-wise significance level of the tests is alpha=0.050.
We rejected the null hypothesis that the population is normal for the populations 3 (p=0.002), 1 (p=0.002), 2 (p=0.001), 4 (p=0.001), 12 (p=0.001), 10 (p=0.000), 8 (p=0.001), and 9 (p=0.002). Therefore, we assume that not all populations are normal.
Because we have more than two populations and the populations and some of them are not normal, we use the non-parametric Friedman test as omnibus test to determine if there are any significant differences between the median values of the populations. We use the post-hoc Nemenyi test to infer which differences are significant. We report the median (MD), the median absolute deviation (MAD) and the mean rank (MR) among all populations over the samples. Differences between populations are significant, if the difference of the mean rank is greater than the critical distance CD=3.137 of the Nemenyi test.
We reject the null hypothesis (p=0.003) of the Friedman test that there is no difference in the central tendency of the populations 3 (MD =0.814+-0.184, MAD=0.160, MR=8.850), 11 (MD=0.841+-0.174, MAD=0.151, MR=8.775), 1 (MD=0.809+-0.183, MAD=0.151, MR=8.662), 2 (MD=0.825+-0.158, MAD=0.124, MR=8.350), 4 (MD=0.829+-0.168, MAD=0.130, MR=8.225), OBLQ_1 (MD=0.820+-0.162, MAD=0.139, MR=7.425), OBLQ_2 (MD=0.820+-0.162, MAD=0.139, MR=7.425), 7 (MD=0.817+-0.161, MAD=0.115, MR=7.350), 12 (MD=0.844+-0.155, MAD=0.141, MR=7.013), 10 (MD=0.848+-0.145, MAD=0.133, MR=6.900), 8 (MD=0.892+-0.168, MAD=0.108, MR=6.737), 6 (MD=0.817+-0.157, MAD=0.141, MR=6.675), 9 (MD=0.846+-0.147, MAD=0.140, MR=6.475), and 5 (MD=0.887+-0.170, MAD=0.109, MR=6.138). Therefore, we assume that there is a statistically significant difference between the median values of the populations.
Based on the post-hoc Nemenyi test, we assume that there are no significant differences within the following groups: 3, 11, 1, 2, 4, OBLQ_1, OBLQ_2, 7, 12, 10, 8, 6, 9, and 5. All other differences are significant.
None
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