

| | Fold 5 | Fold 4 | Fold 3 | Fold 2 | Fold 1 |
|-------------|--|--|--|--|---|
| VGG19 | Test 0.982857167 7207947 Val0.9892857 074737549 AUc_roc | Test 0.9878571629 524231 Val 0.9821428656 578064 AUc_roc | Test 0.9907143115 997314 Val 0.9857142567 634583 AUc_roc | Test 0.98500001430 51147 Val0.99464285 373687741 AUc_roc | Test 0.9907143115 997314 Val 0.9883928298 9501951 AUc_roc |
| DenseNet121 | Test 0.98785716295 24231 Val0.99107140 30265808 AUc_roc | Test 0.9907143115 997314 Val 0.9830357432 365417 AUc_roc | Test 0.9885714054 107666 Val0.9857142 567634583 AUc_roc | Test 0.99071431159 97314 Val 0.99374997615 81421 AUc_roc | Test 0.9864285588 264465 Val 0.9839285612 106323 AUc_roc |
| ResNet50 | Test 0.98642855882 64465 Val0.98660713 43421936 AUc_roc | Test 0.9892857074 737549 Val0.9937499 761581421 AUc_roc | Test 0.9885714054 107666 Val0.9919642 806053162 AUc_roc | Test0.9878571 629524231 Val0.99107140 302658081 AUc_roc | Test 0.9871428608 894348 Val 0.9848214387 893677 AUc_roc |

| | | | | | |
|---|--------------------|--------------------|--------|--------|--------|
| By using val accuracy as weights sugeno | 0.991428 | 0.9935714285714285 | 0.9936 | 0.9910 | 0.9910 |
| Weighted average using val accuracies | | | | | |
| Average ensembling | 0.9864285714285714 | | | | |
| Majority voting | 0.9935714285714285 | | | | |

Fold1

Average ensembling

| | | | | | |
|-----------------------------------|--|--|--|--|--|
| 0.9857142857142858 | | | | | |
| [[700 0] | | | | | |
| [20 680]] | | | | | |
| precision recall f1-score support | | | | | |
| 0 0.97 1.00 0.99 700 | | | | | |
| 1 1.00 0.97 0.99 700 | | | | | |
| accuracy 0.99 1400 | | | | | |
| macro avg 0.99 0.99 0.99 1400 | | | | | |
| weighted avg 0.99 0.99 0.99 1400 | | | | | |

Weighted average with val accuracy ensembling

| | | | | | |
|-----------------------------------|--|--|--|--|--|
| 0.9914285714285714 | | | | | |
| precision recall f1-score support | | | | | |
| 0 0.99 0.99 0.99 700 | | | | | |
| 1 0.99 0.99 0.99 700 | | | | | |
| accuracy 0.99 1400 | | | | | |
| macro avg 0.99 0.99 0.99 1400 | | | | | |

| | | | | |
|--------------|------|------|------|------|
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |
|--------------|------|------|------|------|

```
[[694 6]
 [ 6 694]]
```

Majority voting

0.9921428571428571

| | precision | recall | f1-score | support |
|---|-----------|--------|----------|---------|
| 0 | 0.99 | 0.99 | 0.99 | 700 |
| 1 | 0.99 | 0.99 | 0.99 | 700 |

| | | | | |
|--------------|------|------|------|------|
| accuracy | | | 0.99 | 1400 |
| macro avg | 0.99 | 0.99 | 0.99 | 1400 |
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |

```
[[694 6]
 [ 5 695]]
```

FOLD 2

Average ensembling

0.99

```
[[696 4]
 [ 10 690]]
```

| | precision | recall | f1-score | support |
|---|-----------|--------|----------|---------|
| 0 | 0.99 | 0.99 | 0.99 | 700 |
| 1 | 0.99 | 0.99 | 0.99 | 700 |

| | | | | |
|--------------|------|------|------|------|
| accuracy | | | 0.99 | 1400 |
| macro avg | 0.99 | 0.99 | 0.99 | 1400 |
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |

Weighted average with val accuracy ensembling

0.9921428571428571

| | precision | recall | f1-score | support |
|---|-----------|--------|----------|---------|
| 0 | 1.00 | 0.99 | 0.99 | 700 |
| 1 | 0.99 | 1.00 | 0.99 | 700 |

| | | | | |
|--------------|------|------|------|------|
| accuracy | | | 0.99 | 1400 |
| macro avg | 0.99 | 0.99 | 0.99 | 1400 |
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |

```
[[691 9]
 [ 2 698]]
```

Majority voting

```
0.9935714285714285
```

| | precision | recall | f1-score | support |
|--|-----------|--------|----------|---------|
|--|-----------|--------|----------|---------|

| | | | | |
|---|------|------|------|-----|
| 0 | 1.00 | 0.99 | 0.99 | 700 |
|---|------|------|------|-----|

| | | | | |
|---|------|------|------|-----|
| 1 | 0.99 | 1.00 | 0.99 | 700 |
|---|------|------|------|-----|

| | | | | |
|----------|--|--|------|------|
| accuracy | | | 0.99 | 1400 |
|----------|--|--|------|------|

| | | | | |
|-----------|------|------|------|------|
| macro avg | 0.99 | 0.99 | 0.99 | 1400 |
|-----------|------|------|------|------|

| | | | | |
|--------------|------|------|------|------|
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |
|--------------|------|------|------|------|

```
[[693 7]
 [ 2 698]]
```

FOLD 3

Average ensembling

```
0.9828571428571429
```

```
[[699 1]
```

```
 [ 23 677]]
```

| | precision | recall | f1-score | support |
|--|-----------|--------|----------|---------|
|--|-----------|--------|----------|---------|

| | | | | |
|---|------|------|------|-----|
| 0 | 0.97 | 1.00 | 0.98 | 700 |
|---|------|------|------|-----|

| | | | | |
|---|------|------|------|-----|
| 1 | 1.00 | 0.97 | 0.98 | 700 |
|---|------|------|------|-----|

| | | | | |
|----------|--|--|------|------|
| accuracy | | | 0.98 | 1400 |
|----------|--|--|------|------|

| | | | | |
|-----------|------|------|------|------|
| macro avg | 0.98 | 0.98 | 0.98 | 1400 |
|-----------|------|------|------|------|

| | | | | |
|--------------|------|------|------|------|
| weighted avg | 0.98 | 0.98 | 0.98 | 1400 |
|--------------|------|------|------|------|

Weighted average using val

Accracies

```
0.9935714285714285
```

| | precision | recall | f1-score | support |
|--|-----------|--------|----------|---------|
|--|-----------|--------|----------|---------|

| | | | | |
|---|------|------|------|-----|
| 0 | 0.99 | 0.99 | 0.99 | 700 |
|---|------|------|------|-----|

| | | | | |
|---|------|------|------|-----|
| 1 | 0.99 | 0.99 | 0.99 | 700 |
|---|------|------|------|-----|

| | | | | |
|----------|--|--|------|------|
| accuracy | | | 0.99 | 1400 |
|----------|--|--|------|------|

| | | | | |
|-----------|------|------|------|------|
| macro avg | 0.99 | 0.99 | 0.99 | 1400 |
|-----------|------|------|------|------|

| | | | | |
|--------------|------|------|------|------|
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |
|--------------|------|------|------|------|

```
[[696 4]
```

```
[ 5 695]]
```

Majority voting

```
0.9942857142857143
```

| | precision | recall | f1-score | support |
|--|-----------|--------|----------|---------|
|--|-----------|--------|----------|---------|

| | | | | |
|---|------|------|------|-----|
| 0 | 0.99 | 1.00 | 0.99 | 700 |
| 1 | 1.00 | 0.99 | 0.99 | 700 |

| | | | | |
|--------------|------|------|------|------|
| accuracy | | | 0.99 | 1400 |
| macro avg | 0.99 | 0.99 | 0.99 | 1400 |
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |

```
[[697 3]
```

```
[ 5 695]]
```

FOLD 4

Average ensembling

```
0.9964285714285714
```

```
[[700 0]
```

```
[ 5 695]]
```

| | precision | recall | f1-score | support |
|--|-----------|--------|----------|---------|
|--|-----------|--------|----------|---------|

| | | | | |
|---|------|------|------|-----|
| 0 | 0.99 | 1.00 | 1.00 | 700 |
| 1 | 1.00 | 0.99 | 1.00 | 700 |

| | | | | |
|--------------|------|------|------|------|
| accuracy | | | 1.00 | 1400 |
| macro avg | 1.00 | 1.00 | 1.00 | 1400 |
| weighted avg | 1.00 | 1.00 | 1.00 | 1400 |

Weighted Average ensembling val accuracies

```
0.9964285714285714
```

| | precision | recall | f1-score | support |
|--|-----------|--------|----------|---------|
|--|-----------|--------|----------|---------|

| | | | | |
|---|------|------|------|-----|
| 0 | 0.99 | 1.00 | 1.00 | 700 |
| 1 | 1.00 | 0.99 | 1.00 | 700 |

| | | | | |
|--------------|------|------|------|------|
| accuracy | | | 1.00 | 1400 |
| macro avg | 1.00 | 1.00 | 1.00 | 1400 |
| weighted avg | 1.00 | 1.00 | 1.00 | 1400 |

```
[[700 0]
```

```
[ 5 695]]
```

Majority voting ensembling

```
0.9971428571428571
```

| | precision | recall | f1-score | support |
|--------------|-----------|--------|----------|---------|
| 0 | 0.99 | 1.00 | 1.00 | 700 |
| 1 | 1.00 | 0.99 | 1.00 | 700 |
| accuracy | | | 1.00 | 1400 |
| macro avg | 1.00 | 1.00 | 1.00 | 1400 |
| weighted avg | 1.00 | 1.00 | 1.00 | 1400 |

```
[[700  0]
 [  4 696]]
```

FOLD 5

Average ensembling

0.9914285714285714

```
[[698  2]
 [ 10 690]]
```

| | precision | recall | f1-score | support |
|--------------|-----------|--------|----------|---------|
| 0 | 0.99 | 1.00 | 0.99 | 700 |
| 1 | 1.00 | 0.99 | 0.99 | 700 |
| accuracy | | | 0.99 | 1400 |
| macro avg | 0.99 | 0.99 | 0.99 | 1400 |
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |

Weighted Average ensembling val accuracies

0.9914285714285714

| | precision | recall | f1-score | support |
|--------------|-----------|--------|----------|---------|
| 0 | 0.99 | 1.00 | 0.99 | 700 |
| 1 | 1.00 | 0.99 | 0.99 | 700 |
| accuracy | | | 0.99 | 1400 |
| macro avg | 0.99 | 0.99 | 0.99 | 1400 |
| weighted avg | 0.99 | 0.99 | 0.99 | 1400 |

```
[[698  2]
 [ 10 690]]
```

Majority voting ensembling

0.9914285714285714

| | precision | recall | f1-score | support |
|--------------|-----------|--------|----------|---------------------|
| 0 | 0.99 | 1.00 | 0.99 | 700 |
| 1 | 1.00 | 0.99 | 0.99 | 700 |
| accuracy | | | | 0.99 1400 |
| macro avg | | | | 0.99 0.99 0.99 1400 |
| weighted avg | | | | 0.99 0.99 0.99 1400 |

```
[[698 2]
 [ 10 690]]
```

FOLD5 sugeno ----optimizer DE--- fuzzy scores---validation----test

RUN 1 [0.32367648 0.86816962 0.20469143] 0.9946428571428572
0.9957142857142857

RUN 2 [0.60652904 0.60761822 0.28470913] 0.9946428571428572
0.9957142857142857

RUN 3 [0.53859704 0.02854854 0.01747606] 0.9946428571428572
0.995

RUN 4 [0.12402031 0.70712827 0.93044628] 0.9946428571428572
0.995

RUN 5 [0.48351541 0.89492229 0.11041567] 0.9946428571428572
0.9957142857142857

RUN 6 [0.21426744 0.64287213 0.96920865] 0.9946428571428572
0.995

RUN 7 [0.21426744 0.64287213 0.96920865] 0.9946428571428572
0.995

RUN 8 [0.49020662 0.98550642 0.23468598] 0.9946428571428572
0.9957142857142857

RUN 9 [0.98869597 0.86393334 0.03321119] 0.9946428571428572
0.9957142857142857

RUN 10 [0.89227778 0.88044519 0.3703405] 0.9946428571428572
0.9957142857142857

FOLD5 sugeno ----optimizer WOA --- fuzzy scores--validation----test

RUN 1 [0.95107526 0.01569268 0.99534048] 0.9973214285714286
0.9942857142857143

RUN 2 [0.4030942 0.05527412 0.99934763] 0.9973214285714286
0.9942857142857143

RUN 3 [0.55045494 0.12633032 1.] 0.9973214285714286
0.9942857142857143

RUN 4 [0.03295115 0.52011902 0.9882743] 0.9973214285714286

0.9942857142857143

RUN 5 [0.95630219 0.96240663 0.99438256] 0.9973214285714286

0.9942857142857143

RUN 6 [0.71605918 0.64315495 0.98328924] 0.9973214285714286

0.9942857142857143

RUN 7 [0.97075886 0.08883613 0.98166732] 0.9973214285714286

0.9942857142857143

RUN 8 [0.7131003 0.21776361 0.99082152] same

RUN 9

RUN 10

FOLD5 sugeno ----optimizer ALO--- fuzzy scores---validation----test

RUN 1 [0.16034194 0.64391513 0.96743945] 0.9964285714285714

0.9978571428571429

RUN 2 [0.71420228 0.95804941 0.974537] same

0.9971428571428571

RUN 3 [0.38510331 0.49781735 0.97157027] 0.9964285714285714

0.9971428571428571

RUN 4 [0.10642452 0.47588309 0.95424527] 0.9964285714285714

0.9978571428571429

RUN 5

RUN 6

RUN 7

RUN 8

RUN 9

RUN 10

FOLD5 sugeno ----optimizer PSO--- fuzzy scores--validation----test

RUN 1 [0.9887952 0.86306685 0.99098409] 0.9982142857142857
0.9964285714285714

RUN 2 [0.82893763 0.73091089 0.99750404] same

RUN 3 [0.85499011 0.29127636 0.99738482]

RUN 4 [0.84924308 0.64260424 0.99246983]

RUN 5 [0.9696713 0.22708502 0.99756281]

RUN 6

RUN 7

RUN 8

RUN 9

RUN 10

FOLD5 sugeno ----optimizer GWO --- fuzzy scores--validation----test

RUN 1 [0.42783132 0.8140165 0.97441626] 0.9964285714285714
0.9971428571428571

RUN 2 [0.00935139 0.28698666 0.97634145] same

RUN 3 [0.09425729 0.63118508 0.99609892] 0.9964285714285714
0.9964285714285714

RUN 4 .9964285714285714 [0.27187688 0.31442534 0.99187676]]
0.9964285714285714

RUN 5 [0.50801472 0.54122559 0.98656387]

RUN 6 [0.22249514 0.4618045 0.99682539]

RUN 7

RUN 8

RUN 9

RUN 10

FOLD 2

FOLD4 sugeno ----optimizer PSO --- fuzzy scores--validation----test

RUN 1 [0.14155013 0.32144721 0.98666431] 0.9973214285714286
0.9978571428571429

RUN 2 [0.37226613 0.97258267 0.79357793] 0.9973214285714286
0.9957142857142857

RUN 3 [0.14779894 0.21197872 0.99251287] 0.9973214285714286
0.9978571428571429

RUN 4 [0.71962655 0.77936295 0.71997678] 0.9973214285714286
0.9957142857142857

RUN 5 [0.58125047 0.1984576 0.11294338] same

RUN 6 [0.39677429 0.21975963 0.98240565] 0.9973214285714286
0.9971428571428571

RUN 7 [0.95383385 0.80555998 0.76330186] 0.9973214285714286
0.9957142857142857

RUN 8 [0.35415377 0.9957061 0.92434237] 0.9971428571428571
0.9971428571428571

RUN 9 [0.60651334, 0.84745409, 0.75516298] 0.9973214285714286
0.9957142857142857

RUN 10 [0.43649999 0.73570982 0.71163253] 0.9973214285714286
0.9957142857142857

FOLD4 sugeno ----optimizer GWO --- fuzzy scores--validation----test

RUN 1 [0.54916156 0.54747232 0.986694] 0.9991071428571429
0.9935714285714285

RUN 2 [0.20283891 0.42523595 0.98387087] 0.9991071428571429
0.9935714285714285

RUN 3 [0.43586674 0.85960831 0.99834852] same

RUN 4 [0.84167826 0.51502948 0.99992421] same

RUN 5 [0.05183547, 0.38720729, 0.97058141] 0.9991071428571429
0.9928571428571429

RUN 6 [0.10833086, 0.06187462, 0.97764078] 0.9991071428571429
0.9935714285714285

RUN 7 0.31269386, 0.28442986, 0.98914188 0.9991071428571429
0.9935714285714285

RUN 8 [0.82761983 1.06492615 1.26400566] 0.9991071428571429
0.9935714285714285

RUN 9 [0.30087103,0.98757259,0.97310368] 0.9991071428571429
0.9935714285714285

RUN 10 [0.3577549 0.35712534 0.96718982] 0.9991071428571429
0.9921428571428571

FOLD4 sugeno ----optimizer ALO --- fuzzy scores---validation----test

RUN 1 [0.55114518 0.07689115 0.99727619] 0.9973214285714286
0.9964285714285714

RUN 2 [0.59181738 0.46832587 0.9858279] 0.9973214285714286
0.9964285714285714

RUN 3 [0.09407955 0.82602469 0.99612685] 0.9973214285714286
0.9964285714285714

RUN 4 [0.99287342 0.36528908 0.99866987] 0.9973214285714286
0.9964285714285714

RUN 5 [0.23828821 0.06097293 0.99059046] 0.9973214285714286
0.9964285714285714

RUN 6 [0.33267819 0.34316128 0.25682687] 0.9973214285714286
0.9942857142857143

RUN 7 [0.65948258 0.49997896 0.99819299] 0.9973214285714286
0.9964285714285714

RUN 8 [0.24653161,0.36117223,0.06183366] 0.9973214285714286
0.9942857142857143

RUN 9 [0.58610074 0.46991475 0.9847972] same

RUN 10

FOLD4 sugeno ----optimizer WOA --- fuzzy scores--validation----test

RUN 1 [0.51403814 0.79114404 0.5401044] 0.9973214285714286
0.9957142857142857

RUN 2 [0.42227517 0.30660857 1.] same

RUN 3 [0.9985825 0.5044867 0.47879358] same

RUN 4 [0.16833095 0.84029941 0.34012531] same

RUN 5 [0.06814429 0.03419037 0.02664247] 0.9982142857142857
0.9942857142857143

RUN 6 [0.97394334 0.91085943 0.58298614] 0.9973214285714286
0.9964285714285714

RUN 7 [0.68644784 0.50619104 0.00652304] same as 1

RUN 8 [0.97464665 0.85698423 0.58567816] 0.997321428571428
0.9964285714285714

RUN 9

RUN 10

FOLD4 sugeno ----optimizer DE --- fuzzy scores--validation----test

RUN 1 [0.45659043 0.30609338 0.14092198] 0.9964285714285714
0.9914285714285714

RUN 2 [0.48471267 0.32832092 0.05943991] 0.9964285714285714
0.9914285714285714

RUN 3 [0.72463714 0.95817371 0.65798384] 0.9964285714285714
0.9914285714285714

RUN 4 [0.2933437 0.75977213 0.6570942] 0.9964285714285714
0.9914285714285714

RUN 5 [0.75583145 0.73851759 0.65880123] same

RUN 6 [0.49789128 0.29476193 0.19614892] same

RUN 7 [0.45000301 0.32216819 0.30685871] same

RUN 8 [0.04447573 0.96921612 0.67935611]

RUN 9

RUN 10

FOLD3 sugeno ----optimizer DE --- fuzzy scores--validation----test

RUN 1 [0.95291643 0.68760189 0.23775024] 0.9928571428571429
0.9942857142857143

RUN 2 [0.64534065 0.83612972 0.37243044] same

RUN 3 [0.19016951 0.53245741 0.96448515] same

RUN 4 [0.37588195 0.50732407 0.97862504] 0.9928571428571429
0.9935714285714285

RUN 5 [0.3865866 0.64041578 0.14318348] 0.9928571428571429
0.9942857142857143

RUN 6 [0.58311317 0.5694053 0.47768654] same

RUN 7 [0.51542778 0.80223316 0.43155849] same

RUN 8 [0.43813565 0.98855613 0.09554704] same

RUN 9

RUN 10

FOLD3 sugeno ----optimizer WOA --- fuzzy scores--validation----test

RUN 1 [0.6661014 0.71419372 0.9951954] 0.9964285714285714
0.995

RUN 2 [0.88412288 0.50571824 0.96855298] same

RUN 3 [0.21511165 0.45711345 0.97290462] same

RUN 4 [0.75433796 0.71535087 0.97406214] same

RUN 5 [0.66562529 0.8454333 0.96281489] same

RUN 6 [0.24303385 0.99076327 0.97516233] same

RUN 7 [0.98171638 0.35450974 0.96394943] same

RUN 8

RUN 9

RUN 10

FOLD3 sugeno ----optimizer GWO --- fuzzy scores--validation----test

RUN 1 [0.8906473 0.21203105 0.96030243] 0.9955357142857143
0.9921428571428571

RUN 2 [0.83767202 0.81775268 0.97841593] same

RUN 3 [0.8234936 0.69098918 0.9603121] same

RUN 4 [0.79389166 0.59120473 0.9891765] same

RUN 5 [0.73184076 0.17931993 0.97685524] same

RUN 6 [0.53141431 0.66685336 0.98828145] same

RUN 7 [0.75063435 0.60796509 0.97322134] same

RUN 8 [0.33532328 0.62529027 0.99736683] same

RUN 9

RUN 10

FOLD3 sugeno ----optimizer ALO--- fuzzy scores--validation----test

RUN 1 [0.23221016 0.55226281 0.98078322]0.9973214285714286
0.995

RUN 2 [0.25969356 0.40303068 0.99556857] same

RUN 3 [0.97790846 0.75607143 0.99801341] same

RUN 4 [0.71531283 0.47220497 0.99454996] same

RUN 5 [0.6906226 0.16690156 0.03511354] same

RUN 6 [0.61792607 0.71534006 0.98103746] same

RUN 7 [0.60512745 0.35452553 0.98609182] same

RUN 8 [0.19737677 0.98914516 0.88131033] 0.9973214285714286
0.9942857142857143

RUN 9 [0.4772072 0.0886186 0.02184508] 0.9973214285714286
0.9942857142857143

RUN 10

FOLD3 sugeno ----optimizer PSO--- fuzzy scores--validation----test

RUN 1 [0.84768304 0.060102 0.11944881] 0.9955357142857143
0.9928571428571429

RUN 2 [0.63325841 0.1541166 0.90051535] same

RUN 3 [0.45860375 0.11513266 0.0646037] same

RUN 4 [0.39393967 0.19615532 0.9651587] 0.9955357142857143
0.9935714285714285

RUN 5 [0.02359912 0.33140774 0.99697598] 0.9955357142857143
0.9942857142857143

RUN 6 [0.14774844 0.18158404 0.85006725] 0.9955357142857143
0.9914285714285714

RUN 7 [0.16884088 0.61049824 0.94177371] 0.9955357142857143
0.9935714285714285

RUN 8 [0.26365628 0.803419 0.96299274] same

RUN 9 [0.90952352 0.17145009 0.11424764] 0.9955357142857143
0.9942857142857143

FOLD2 Sugeno ----optimizer PSO--- fuzzy scores--validation----test

RUN 1 [0.61896258 0.27925586 0.97964067] 0.9964285714285714
0.995

RUN 2 [0.36932036 0.65039436 0.36783057] 0.9964285714285714
0.9957142857142857

RUN 3 [0.01347748 0.99493361 0.1875466] same

RUN 4 [0.8265352 0.87483032 0.95134771] 0.9964285714285714
0.9978571428571429

RUN 5 [0.3861172 0.85959773 0.05674748] same

RUN 6 [0.53549968 0.36320583 0.9489723] 0.9964285714285714
0.9978571428571429

RUN 7 [0.2442322 0.87358098 0.32682205] same

RUN 8 [0.34232382 0.56038747 0.19163023] 0.9964285714285714
0.9957142857142857

RUN 9 [0.84844584 0.91338307 0.49267925] same

RUN 10 [0.9725345 0.78056705 0.34576289] same

FOLD2 Sugeno ----optimizer ALO--- fuzzy scores--validation----test

RUN 1 [0.59285402 0.88126816 0.16236548] 100
0.995

RUN 2 [0.27203565 0.96960714 0.26990905] same

RUN 3 [0.55458221 0.99988759 0.01018874] 100
0.9942857142857143

RUN 4 [0.59606435 0.67656373 0.11867482] same

RUN 5 [0.94814881 0.41743606 0.23799292] same

RUN 6 [0.35221801 0.43437616 0.00418428] same

RUN 7 [0.97375227 0.78645045 0.13906679] same

RUN 8 [0.92755109 0.98974709 0.00403643] same

RUN 9 [0.83906944 0.56418522 0.24122818] same

RUN 10

FOLD2 Sugeno ----optimizer GWO--- fuzzy scores--validation----test

RUN 1 [0.95937016 0.06107289 0.22524846] 0.9973214285714286
0.9914285714285714

RUN 2 [0.40597012 0.08047403 0.21000856] same

RUN 3 [0.86784909 0.8240462 0.81933056] same

RUN 4 [0.9746276 0.40313778 0.80476679] same

RUN 5 [0.88085761 0.69131435 0.9884216] 0.9973214285714286
0.9928571428571429

RUN 6 [0.67210375 0.1275915 0.75152838] 0.9973214285714286
0.9921428571428571

RUN 7 [0.73301329 0.06543913 0.79292718] 0.9973214285714286
0.9914285714285714

RUN 8 [0.01 0.14036211 0.87492271] same

RUN 9

RUN 10

FOLD2 Sugeno ----optimizer WOA--- fuzzy scores--validation----test

RUN 1 [0.36476755 0.55630272 0.44590543] 0.9973214285714286
0.9935714285714285

RUN 2 [0.56714438 0.60226998 0.31570037] 0.9973214285714286
0.9935714285714285

RUN 3 [0.94598419 0.82196735 0.96889117] 0.9973214285714286
0.992

RUN 4 [0.34343811 0.99155628 0.8896771] 0.9973214285714286
0.9935714285714285

RUN 5 [0.39728414 0.99234576 0.1468329] same

RUN 6 [0.70999624 0.6361078 0.35637642] same

RUN 7 [0.74305934 0.98357217 0.03938321] same

RUN 8 [0.16065645 0.99115229 0.56586762] same
0.995

RUN 9

RUN 10

FOLD2 Sugeno ----optimizer WOA--- fuzzy scores--validation----test

RUN 1 [0.94094327 0.87347986 0.98327261] 0.9982142857142857
0.9921428571428571

RUN 2 [1. 0.74613463 1.] same

RUN 3 [0.28887654 0.85883144 1.] same

RUN 4 [0.27214674 0.96939177 0.98288514] same

RUN 5 [0.14929495 0.31505005 0.98889598] same

RUN 6 [0.41178108 0.24329232 1.] same

RUN 7 [0.33801701 0.01773359 0.00914726] same

RUN 8 [0.59426056 0.43689297 0.98676035] same

RUN 9 [0.91713888 0.92483576 0.98250301] same

RUN 10

FOLD1 Sugeno ----optimizer GWO--- fuzzy scores--validation----test

RUN 1 [0.28869815 0.91688598 0.94985095] 0.9955357142857143
0.9928571428571429

RUN 2 [0.90062777 0.34869173 0.99402625] 0.9955357142857143
0.9957142857142857

RUN 3 [0.61855764 0.98223426 0.99990116] 0.9955357142857143
0.9957142857142857

RUN 4 [0.99446649 0.01297396 0.97012457] 0.9955357142857143
0.9942857142857143

RUN 5 [0.90779453 0.83136756 0.98369072] 0.9955357142857143
0.995

RUN 6 [0.12792811 0.44524962 0.99874868] 0.9955357142857143
0.9957142857142857

RUN 7 [0.84216752 0.62032512 0.97322323] 0.9955357142857143
0.9942857142857143

RUN 8 [0.07036999 0.31841592 0.96040562] 0.9955357142857143
0.9935714285714285

RUN 9 [0.379241 0.42921905 0.95544338] same

RUN 10 [0.74688951 0.80643511 0.95303554] 0.9955357142857143
0.9928571428571429

FOLD1 Sugeno ----optimizer PSO--- fuzzy scores--validation----test

RUN 1 [0.86227389 0.50764036 0.96954106] 0.9955357142857143
0.9935714285714285

RUN 2 [0.68622802 0.30138139 0.99510591] 0.9955357142857143
0.9942857142857143

RUN 3 [0.96832933 0.79032821 0.98267022] 0.9955357142857143
0.9935714285714285

RUN 4 [0.87119681 0.3567471 0.98993024] same

RUN 5 [0.70245874 0.31690481 0.95837536] same

RUN 6 [0.49414405 0.84194098 0.98836498] 0.9955357142857143
0.9935714285714285

RUN 7 [0.69947631 0.74043635 0.97580122] same

RUN 8 [0.65534153 0.45528812 0.98565047] same

RUN 9

RUN 10

FOLD1 Sugeno ----optimizer WOA--- fuzzy scores--validation----test

RUN 1 [0.87488587 0.26436502 0.98443277] 0.9964285714285714
0.9935714285714285

RUN 2 [0.48199326 0.76301789 0.97594032] 0.9964285714285714
0.9928571428571429

RUN 3 [0.00635625 0.62682461 0.98082298] 0.9964285714285714
0.9935714285714285

RUN 4 [0.71813836 0.73898868 0.96978682] 0.9964285714285714
0.9921428571428571

RUN 5 [0.33044881 0.86048895 0.98024745] 0.9964285714285714
0.9935714285714285

RUN 6 [0.17797772 0.45535583 0.97491381] 0.9964285714285714
0.9928571428571429

RUN 7 [0.52525098 0.62323728 0.98945885] 0.9964285714285714
0.9935714285714285

RUN 8 [0.40918803 0.27254635 0.97002079] same

RUN 9

RUN 10

FOLD1 Sugeno ----optimizer ALO--- fuzzy scores--validation----test

RUN 1 [0.69304202 0.9819941 0.90601665] 0.9982142857142857
0.9957142857142857

RUN 2 [0.723968 0.84999397 0.80611018] same

RUN 3 [0.58680348 0.19906347 0.10325644] 0.9982142857142857
0.995

RUN 4 [0.38373267 0.07933815 0.04862205] 0.9982142857142857
0.9957142857142857

RUN 5 [0.84721371 0.2077642 0.08222739] 0.9982142857142857
0.995

RUN 6 [0.37504518 0.20166127 0.13455769] 0.9982142857142857
0.995

RUN 7 [0.56472544 0.23015448 0.92547217] same

RUN 8 [0.69415197 0.90141054 0.80896715] 0.9982142857142857
0.9957142857142857

RUN 9

RUN 10

FOLD1 Sugeno ----optimizer DE--- fuzzy scores--validation----test

RUN 1 [0.88427288 0.83184164 0.80180382] 0.9964285714285714
0.9935714285714285

RUN 2 [0.78084663 0.19636901 0.16058511] same

RUN 3 [0.51388341 0.02098168 0.80578112] 0.9964285714285714
0.9921428571428571

RUN 4 [0.66441778 1. 0.80465709] 0.9964285714285714
0.9935714285714285

RUN 5 [0.72602726 0.70471073 0.80518306] 0.9964285714285714
0.9921428571428571

RUN 6 [1. 0.78955294 0.80292817] same

RUN 7 [0.57596535 0.79921947 0.80488511] same

RUN 8 [0.75523624 0.52702442 0.80056234] same

RUN 9

RUN 10

\begin{figure*}[]

\includegraphics[width=\textwidth]{fold2_cv.png}

\centering

\caption{Represents the mean accuracies of our proposed method using various optimization algorithms along with the accuracies achieved by other ensembling methods in the case of cross-validation Fold 2.}

```
\label{fig:cvfold2}
\end{figure*}
```

```
\begin{figure*}[]
\includegraphics[width=\textwidth]{fold3_cv.png}
\centering
\caption{Represents the mean accuracies of our proposed method using various optimization
algorithms along with the accuracies achieved by other ensembling methods in the case of
cross-validation Fold 3.}
\label{fig:cvfold3}
\end{figure*}
```

```
\begin{figure*}[]
\includegraphics[width=\textwidth]{fold4_cv.png}
\centering
\caption{Represents the mean accuracies of our proposed method using various optimization
algorithms along with the accuracies achieved by other ensembling methods in the case of
cross-validation Fold 4.}
\label{fig:cvfold4}
\end{figure*}
```

```
\begin{figure*}[]
\includegraphics[width=\textwidth]{fold5_cv.png}
\centering
\caption{Represents the mean accuracies of our proposed method using various optimization
algorithms along with the accuracies achieved by other ensembling methods in the case of
cross-validation Fold 5.}
\label{fig:cvfold5}
\end{figure*}
```

```
\begin{figure*}[]
\includegraphics[width=\textwidth]{fold5_cv.png}
\centering
\caption{Represents the average of the performances of our proposed method using various
optimization algorithms along with the performances by other ensembling methods for all the
cross-validation folds.}
\label{fig:cvfold5}
\end{figure*}
```

Here the working of the Sugeno integral method as a classifier combination is shown in the form of an example.

Let us consider a case where we have a classifier set

$X = \{x_1, x_2, x_3\}$ such that the confidence scores for TB class and Normal class are defined as $r(x_1) = 0.2$, $r(x_2) = 0.3$ and $r(x_3) = 0.5$. The fuzzy measures are defined as $\mu(x_1) = 0.2$, $\mu(x_2) = 0.4$ and $\mu(x_3) = 0.5$ then,

We calculate the Sugeno λ fuzzy-measure as,

$$1 + \lambda = \prod_{i=1}^n (\mu(x_i) \lambda + 1)$$

The characteristic equation,

$$4\lambda^3 + 38\lambda^2 + 10\lambda = 0$$

By solving the above characteristic equation the values of λ we get are, $\lambda = 0$, $\lambda = -0.27$ and $\lambda = -9.23$.

For $\lambda = -0.27$, using the equation below,

$$\mu(x_2, x_3) = \mu(x_2) + \mu(x_3) + \lambda \mu(x_2) \mu(x_3)$$

we get $\mu(x_2, x_3) = 0.846$ and using $\mu(x_2, x_3)$ and $\mu(x_3)$,

$$\mu(x_1, x_2, x_3) = \mu(x_2, x_3) + \mu(x_1) + \lambda \mu(x_2, x_3) \mu(x_1)$$

the value of $\mu(x_1, x_2, x_3)$ is calculated to be 1.00031 or 1.00 (approx).

Also by adding all the fuzzy measures we get,

$$\mu(x_1) + \mu(x_2) + \mu(x_3) = 1.1$$

which is more than the value of $\mu(x_1, x_2, x_3)$. Therefore, the value of λ is considered as -0.27.

With this value of λ we calculate the other fuzzy measures i.e., $\mu(x_1, x_2) = 0.578$ and $\mu(x_1, x_3) = 0.673$.

Therefore all the fuzzy-measures are,

$$\begin{aligned} \mu(\phi) &= 0 \\ \mu(x_1) &= 0.2 \\ \mu(x_2) &= 0.4 \\ \mu(x_3) &= 0.5 \\ \mu(x_1, x_2) &= 0.578 \\ \mu(x_2, x_3) &= 0.846 \\ \mu(x_1, x_3) &= 0.673 \\ \mu(x_1, x_2, x_3) &= 1.00 \end{aligned}$$

%which is greater than 1 or $\mu(x_1, x_2, x_3)$. Therefore, we consider the λ to be -0.27.

Hence the Sugeno integral is given by,

$$\int_{n=1}^3 r(x) d\mu = \max(\min(r(x_1), \mu(x_1, x_2, x_3)), \min(r(x_2), \mu(x_2,$$

$x_3)), \min(r(x_3), \mu(x_3)))$

$$\int_{n=1}^3 r(x) d\mu = \max(\min(0.2, 1), \min(0.3, 0.846), \min(0.5, 0.5))$$

Putting the required values we get,

$$\int_{n=1}^3 r(x) d\mu = \max(\min(0.2, 1), \min(0.3, 0.846), \min(0.5, 0.5))$$

$$\int_{n=1}^3 r(x) d\mu = \max(\min(0.2, 1), \min(0.3, 0.846), \min(0.5, 0.5))$$

$$\int_{n=1}^3 r(x) d\mu = \max(\min(0.2, 1), \min(0.3, 0.846), \min(0.5, 0.5))$$

So, finally the value of the Sugeno integral is 0.5.