

MVA Optimization Using Correlation Based Method

Progress Report on Tau Final States of TTTT

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Outline

- 1 BDT Overall Strategy
- 2 1Tau1L
- 3 1Tau2OS
- 4 2Tau1L
- 5 Event Yield
- 6 Results of all training
 - 1tau2os
 - 2tau1l

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Correlation based optimazation stradegy

- Start with **50** leading input variables, choose the one with least number of input variables yet good performance(60% training)
- Remove bjetsL and bjetsT related variables
- Find the **largest** correlation pair and remove one variable with smaller separation power in the pair
- Repeat the last step until there is only one variable left
- Plot the AUC as a function of number of input variables

TMVA Setup

- ROOT version
 - Switched to ROOT6.12/07, TMVA version 4.3.0
 - New TMVA version comes with new feature

- Training setup
 - Signal: TTTT_TuneCP5;
 - Background: all bg except H and HH and minor ones
 - 60% goes to training and 40% goes to testing
 - Global weight and event weight same in event yield calculation
 - have added more interesting variables:
 - sphericity, aplanarity
 - added some nonjets variables
 - Dealing with negative weight events :InverseBoostNegWeights(Boost With inverse boostweight), Boost With inverse boostweight(Pair events with negative and positive weights in training sample and *annihilate* them)
 - 4 boosting algorithm: BDT(A), BDTG, BDTB, BDTD (all use the default InverseBoostNegWeights)

- Hyperparameters
 - Using the default

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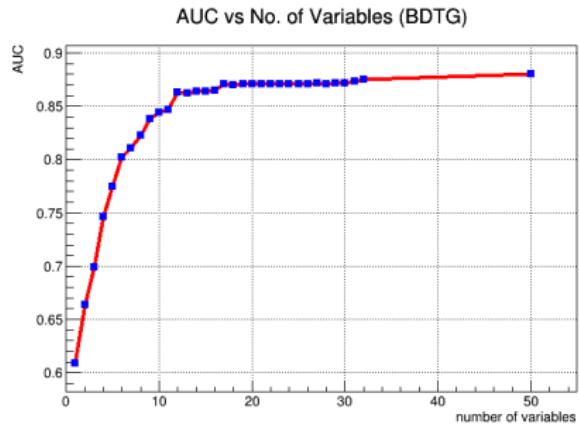
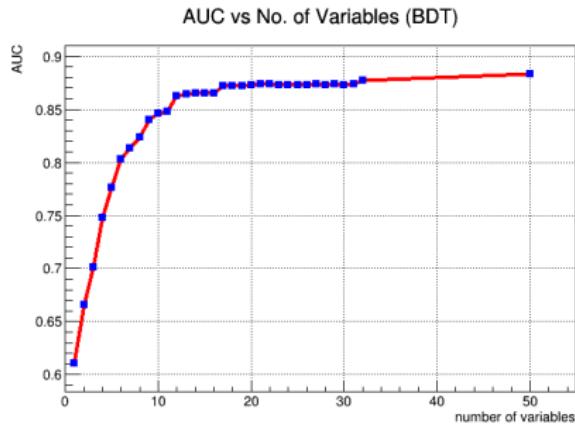
Input variable sets

1tau1I	
1: jets_bScore	0.2761
2: jets_4largestBscoreSum	0.2611
3: bjetsM_num	0.2373
4: bjetsM_3pt	0.2363
5: bjetsL_num	0.2265
7: bjetsL_3pt	0.2079
7: bjetsL_4pt	0.1936
8: jets_7pt	0.1804
9: jets_number	0.1791
10: toptagger_HT	0.1697
11: bjetsL_HT	0.1651
12: toptagger_transMass	0.1635
13: bjetsL_invariantMass	0.1567
14: bjetsL_transMass	0.1515
15: bjetsM_invariantMass	0.1477
16: jets_6pt	0.1461
17: bjetsT_num	0.1429
18: jets_8pt	0.1405
20: jets_3pt	0.1393
20: toptagger_invariantMass	0.1357
21: toptagger_num	0.1351
22: bjetsM_HT	0.1307
23: toptagger_2pt	0.1295
24: toptagger_minDeltaR_v1	0.1195
25: jets_5pt	0.1172
26: bjetsM_transMass	0.1153
27: jets_transMass	0.1116
28: jets rationHT_4toRest	0.1109
29: jets_HT	0.1048
30: nonbjetsM_num	0.1015
31: bjetsT_invariantMass	0.09939
32: bjetsL_minDeltaR	0.09777
33: bjetsM_4pt	0.09661
35: bjetsL_2pt	0.09659
35: jets_4pt	0.09183
36: bjetsT_HT	0.09058
37: jets_9pt	0.08548
38: bjetsT_transMass	0.08038
39: nonbjetsT_num	0.07897
40: nonbjetsM_4pt	0.07253
41: bjetsM_2pt	0.07138
42: bjetsM_minDeltaR	0.07062
43: nonbjetsT_4pt	0.06607
44: jets_3pt	0.06277
45: bjetsT_2pt	0.06104
46: toptagger_3pt	0.05575
47: jets_1pt	0.05548
48: bjetsT_minDeltaR	0.05531
49: toptagger_MHT	0.05152
50: bjetsM_1pt	0.04679

1tau1I	
1: jets_4largestBscoreSum	0.2611
2: bjetsM_3pt	0.2363
3: jets_7pt	0.1804
4: jets_6pt	0.1461
5: jets_8pt	0.1405
6: toptagger_invariantMass	0.1357
7: toptagger_minDeltaR_v1	0.1195
8: jets_rationHT_4toRest	0.1109
9: bjetsM_4pt	0.09661
10: jets_9pt	0.08548
11: nonbjetsM_4pt	0.07253
12: bjetsM_2pt	0.07138
13: bjetsM_minDeltaR	0.07062
14: jets_3pt	0.06277
15: toptagger_3pt	0.05575
16: toptagger_MHT	0.05152
17: bjetsM_1pt	0.04679

1tau1I	
1: bjetsM_3pt	0.2363
2: jets_6pt	0.1461
3: toptagger_minDeltaR_v1	0.1195
4: jets_rationHT_4toRest	0.1109
5: bjetsM_4pt	0.09661
6: jets_9pt	0.08548
7: nonbjetsM_4pt	0.07253
8: bjetsM_minDeltaR	0.07062
9: jets_3pt	0.06277
10: toptagger_3pt	0.05575
11: toptagger_MHT	0.05152
12: bjetsM_1pt	0.04679

AUC results

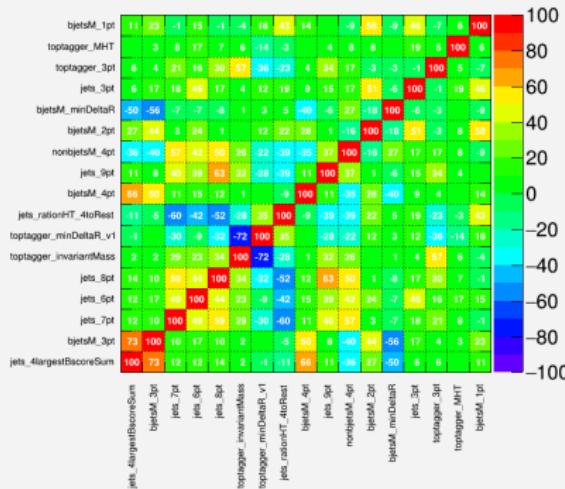


- variable list 15 is going to be our final input variables for BDT
- BDTG and BDT has very similar performance

17 input variables set

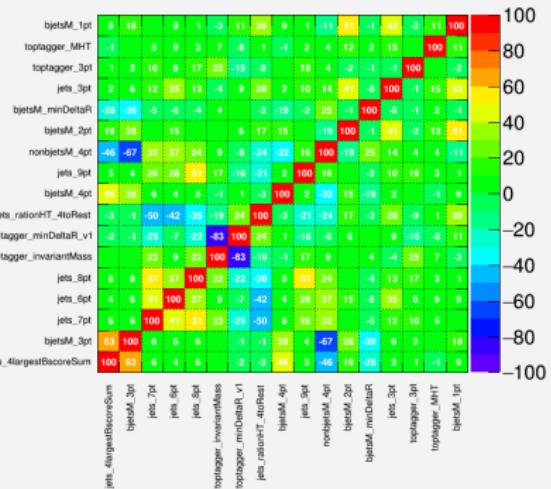
Correlation Matrix (signal)

(17 input variables)



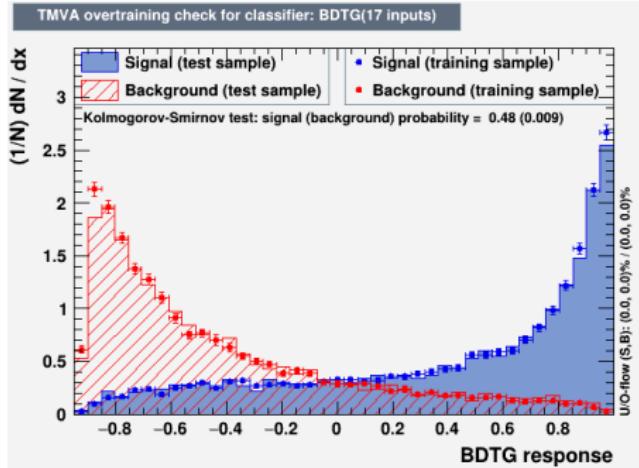
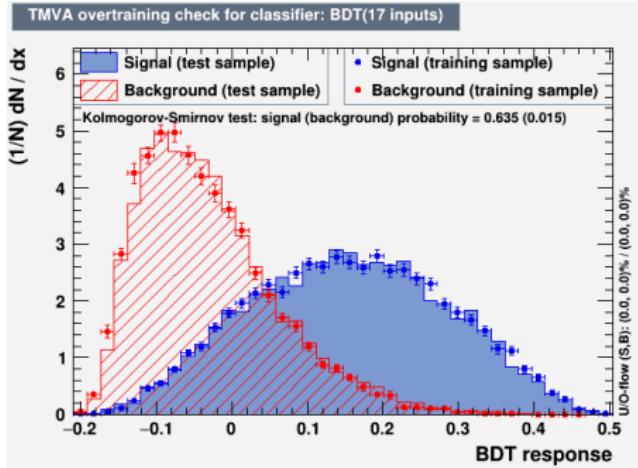
Correlation Matrix (background)

(17 input variables)



- in parentheses below the title is the number of input variable for training
- this is the correlation matrix for training with 17 input variables

17 input variables set



- number in the parenthesis after the title indicates the number of input variables
- so this is the overtraining check plot for 17 input variables

Outline

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3 1Tau2OS

4 2Tau1L

5 Event Yield

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- 1tau2os
- 2tau1l

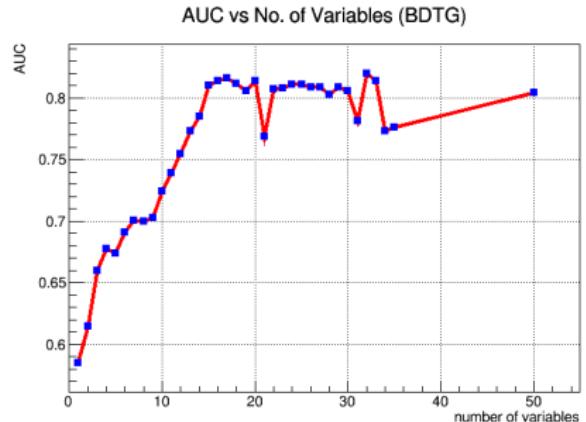
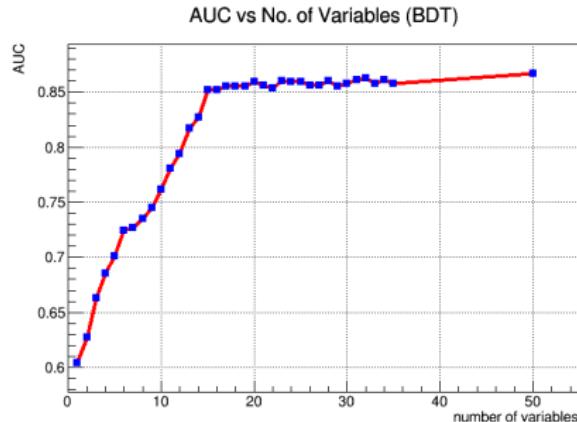
Input variables

1tau2os	
1: jets_bScore	0.3179
2: jets_4largestBscoreSum	0.309
3: bjetsM_num	0.2818
4: bjetsM_3pt	0.2801
5: bjetsL_num	0.2653
6: bjetsL_3pt	0.24
7: toptagger_HT	0.1981
8: bjetsL_4pt	0.191
9: bjetsL_minDeltaR	0.1635
10: jets_number	0.1591
11: jets_6pt	0.1555
12: jets_ratioHT_4toRest	0.1505
13: jets_5pt	0.1471
14: toptagger_transMass	0.1362
15: bjetsT_num	0.1359
16: bjetsT_3pt	0.1329
17: toptagger_invariantMass	0.1262
18: bjetsM_minDeltaR	0.1222
19: bjetsL_invariantMass	0.119
20: toptagger_num	0.1103
21: bjetsL_HT	0.1083
22: jets_HT	0.1078
23: toptagger_MHT	0.1057
24: bjetsM_invariantMass	0.1042
25: bjetsM_4pt	0.09708
26: bjetsL_transMass	0.09473
27: jets_7pt	0.09376
28: bjetsL_tausF_minDeltaR	0.09017
29: jets_aplanarity	0.08952
30: toptagger_minDeltaR_v1	0.08646
31: bjetsM_HT	0.08064
32: toptagger_2pt	0.08034
33: toptagger_1pt	0.07936
34: jets_4pt	0.07908
35: bjetsT_invariantMass	0.07725
36: bjetsT_minDeltaR	0.07591
37: tausF_HT	0.07326
38: bjetsM_transMass	0.07208
39: tausL_HT	0.06956
40: jetsT_HT	0.06739
41: jets_tausF_minDeltaR	0.06735
42: tausL_MHT	0.06648
43: nonbjetsT_num	0.06614
44: tausF_MHT	0.06609
45: jets_3pt	0.06521
46: tauL_1pt	0.0638
47: bjetsL_2pt	0.06353
48: nonbjetsM_num	0.06346
49: jetL_minDeltaR	0.06313
50: jets_average_deltaR	0.06268

1tau2os	
1: jets_bScore	0.3179
2: jets_4largestBscoreSum	0.309
3: bjetsM_num	0.2818
4: bjetsM_3pt	0.2801
5: toptagger_HT	0.1981
6: jets_number	0.1591
7: jets_6pt	0.1555
8: jets_ratioHT_4toRest	0.1505
9: jets_5pt	0.1471
10: toptagger_transMass	0.1362
11: toptagger_invariantMass	0.1262
12: bjetsM_minDeltaR	0.1222
13: toptagger_num	0.1103
14: jets_HT	0.1078
15: toptagger_MHT	0.1057
16: bjetsM_invariantMass	0.1042
17: bjetsM_4pt	0.09708
18: jets_aplanarity	0.08952
19: toptagger_minDeltaR_v1	0.08646
20: bjetsM_HT	0.08064
21: toptagger_2pt	0.08034
22: toptagger_1pt	0.07936
23: jets_4pt	0.07908
24: tausF_HT	0.07326
25: bjetsM_transMass	0.07208
26: tausL_HT	0.06956
27: jets_tausF_minDeltaR	0.06735
28: tausL_MHT	0.06648
29: tausF_MHT	0.06609
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33: jetL_minDeltaR	0.06313
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1tau2os	
1: bjetsM_3pt	0.2801
2: jets_6pt	0.1555
3: bjetsM_minDeltaR	0.1222
4: toptagger_MHT	0.1057
5: bjetsM_4pt	0.09708
6: jets_aplanarity	0.08952
7: toptagger_2pt	0.08034
8: toptagger_1pt	0.07936
9: bjetsM_transMass	0.07208
10: jets_tausF_minDeltaR	0.06735
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AUC results

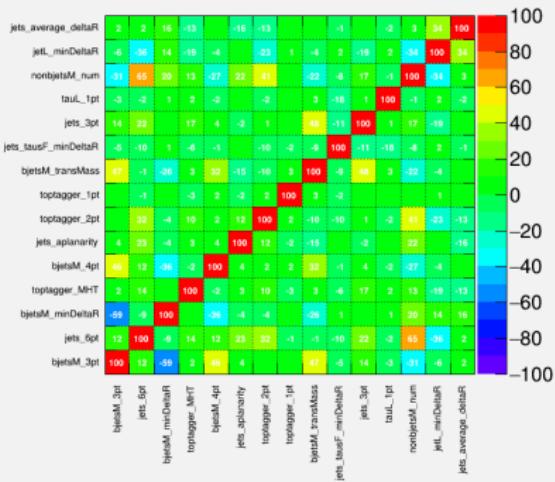


- variable list 15 is going to be our final input variables for BDT
- not sure why BDT_G plot is not smooth? I am guessing BDTG is very sensitive to statistic compared to BDT

15 input variables set

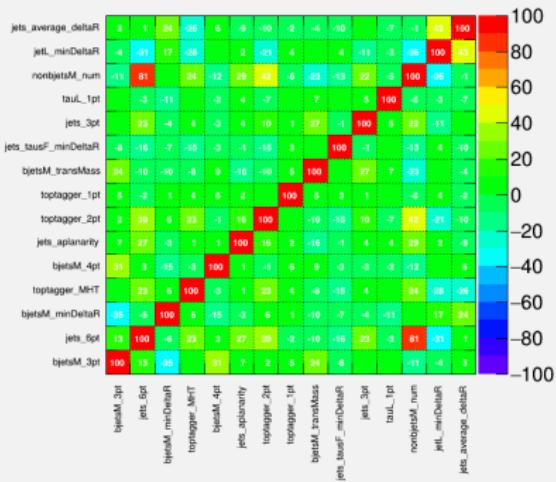
Correlation Matrix (signal)

(15 input variables)

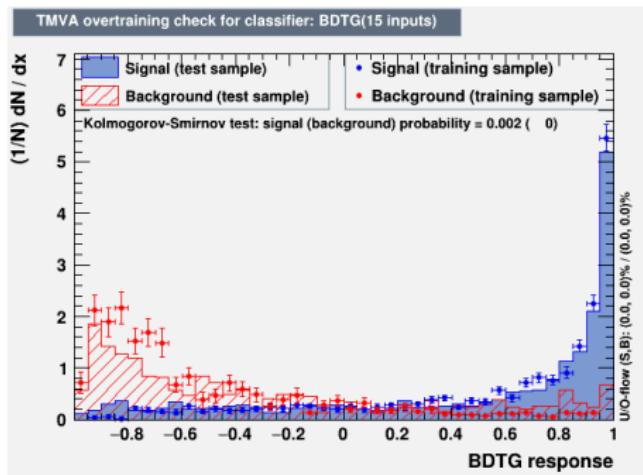
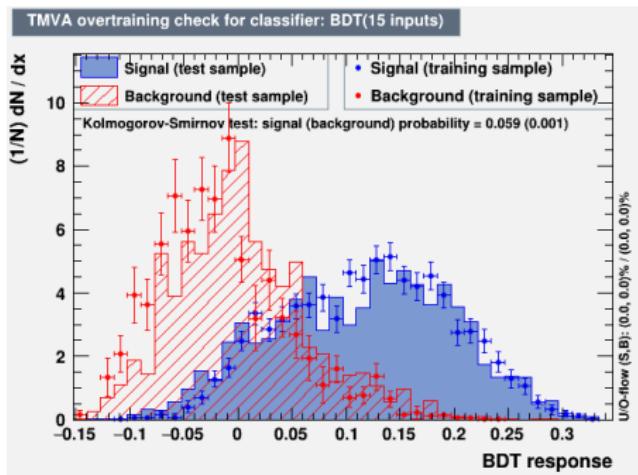


Correlation Matrix (background)

(15 input variables)



15 input variables set



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2 1Tau1L

3 1Tau2OS

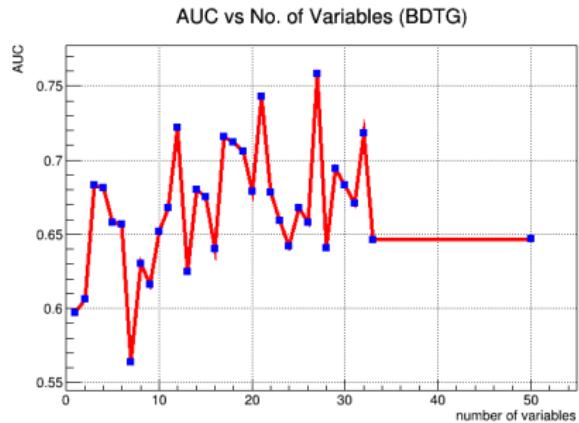
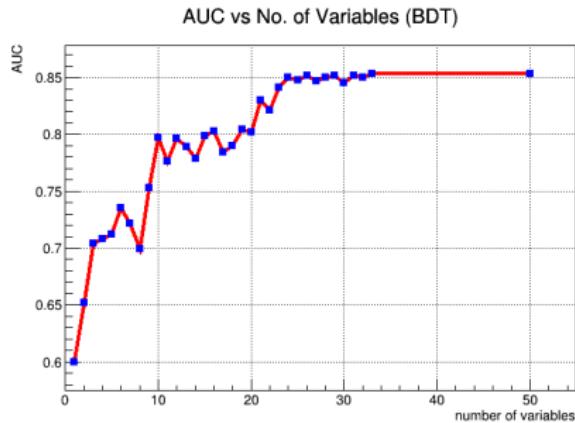
4 2Tau1L

5 Event Yield

6 Results of all training

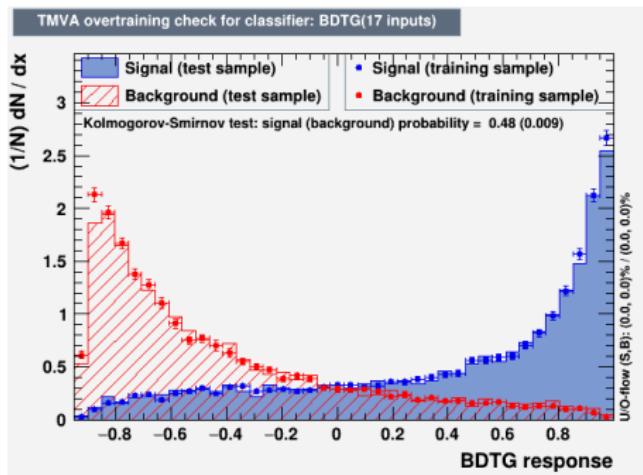
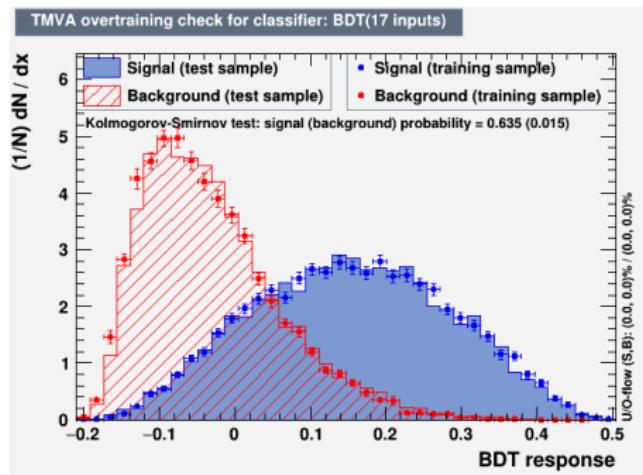
- 1tau2os
- 2tau1l

AUC results



- not sure if the fluctuation is due to low statistic or overtraining
- it seems BDTG is performing poorly for lower statistics

17 input variables



Next Step

- Add more variables
- add various correction
- Hyperparameter optimazation (SS AN)
- maybe loosen baseline selection for higher statistics

Backup

back up

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EventSelection

- MET filters
- HLT requirements
 - HLT_PFHT450_SixJet40_BTagCSV_p056==1,
HLT_PFHT400_SixJet30_DoubleBTagCSV_p056==1
 - HLT_PJet450
- loose preselection
 - tausL.size()>0, jets.size()>2(fixed here), bjetsL.size()>1
 - HT>400
- Subchannel requirements

MC reweighting

- genWeight
- prefireWeight
- PileUp reweighting

Event Yield

1Tau0L

raw entries:

```
TTTT = 237121.000000
TT = 45781.000000
TTX = 59520.000000
VV = 9.000000
VVV = 100.000000
WJets = 0.000000
DY = 0.000000
singleTop = 3795.000000
TX = 7749.000000
QCD = 315.000000
background = 7787.433668
```

1Tau0L

weighted:

```
TTTT = 1727.402161
TT = 12608721.094352
TTX = 76752.367739
VV = 715.464884
VVV = 13.558634
WJets = 0.000000
DY = 0.000000
singleTop = 178.302566
TX = 7694.366862
QCD = 279.102358
background = 13822.328266
```

1Tau0L

scaled to LUMI:

```
TTTT = 9.463574
TT = 6151.841389
TTX = 237.177114
VV = 0.138518
VVV = 1.103006
WJets = 0.000000
DY = 0.000000
singleTop = 115.069084
TX = 13.340787
QCD = 7303.658368
background = 13822.328266
```

1Tau2L

raw entries:

```
TTTT = 36053.000000
TT = 670.000000
TTX = 5439.000000
VV = 0.000000
VVV = 6.000000
WJets = 0.000000
DY = 0.000000
singleTop = 2286.000000
TX = 800.000000
QCD = 0.000000
background = 21.088795
```

1Tau2L

weighted:

```
TTTT = 277.013738
TT = 49317.260154
TTX = 5682.610249
VV = 0.000000
VVV = 0.725201
WJets = 0.000000
DY = 0.000000
singleTop = 114.770694
TX = 799.258622
QCD = 0.000000
background = 46.837393
```

1Tau2L

scaled to LUMI:

```
TTTT = 1.517636
TT = 31.243461
TTX = 14.239847
VV = 0.000000
VVV = 0.106212
WJets = 0.000000
DY = 0.000000
singleTop = 0.292115
TX = 0.955757
QCD = 0.000000
background = 46.837393
```

1Tau3L

raw entries:

```
TTTT = 2215.000000
TT = 0.000000
TTX = 321.000000
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 22.000000
TX = 27.000000
QCD = 0.000000
background = 0.882240
```

1Tau3L

weighted:

```
TTTT = 16.702130
TT = 0.000000
TTX = 323.867294
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 1.096257
TX = 27.411090
QCD = 0.000000
background = 0.840136
```

1Tau3L

scaled to LUMI:

```
TTTT = 0.091504
TT = 0.000000
TTX = 0.803764
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 0.002790
TX = 0.033581
QCD = 0.000000
background = 0.840136
```

Event Yield

1Tau1Mu

raw entries:

```
TTTT = 96510.000000
TT = 15790.000000
TTX = 17317.000000
VV = 6.000000
VVV = 9.000000
WJets = 0.000000
DY = 0.000000
singleTop = 2222.000000
TX = 2782.000000
QCD = 0.000000
background = 80.029567
```

1Tau1Mu

weighted:

```
TTTT = 750.623160
TT = 1986843.247954
TTX = 20245.956260
VV = 465.543882
VVV = 0.607881
WJets = 0.000000
DY = 0.000000
singleTop = 114.866833
TX = 2706.830801
QCD = 0.000000
background = 1081.337876
```

1Tau1Mu

scaled to LUMI:

```
TTTT = 4.113429
TT = 1005.211880
TTX = 56.540381
VV = 0.078666
VVV = 0.079142
WJets = 0.000000
DY = 0.000000
singleTop = 15.823899
TX = 3.603908
QCD = 0.000000
background = 1081.337876
```

1Tau1E

raw entries:

```
TTTT = 77566.000000
TT = 13243.000000
TTX = 14947.000000
VV = 2.000000
VVV = 19.000000
WJets = 0.000000
DY = 0.000000
singleTop = 2857.000000
TX = 2322.000000
QCD = 2.000000
background = 82.771878
```

1Tau1E

weighted:

```
TTTT = 595.308610
TT = 1714597.442319
TTX = 17514.991634
VV = 414.892860
VVV = 1.584673
WJets = 0.000000
DY = 0.000000
singleTop = 122.716495
TX = 2319.020958
QCD = 2.174466
background = 939.704393
```

1Tau1E

scaled to LUMI:

```
TTTT = 3.261433
TT = 864.721378
TTX = 48.748242
VV = 0.032859
VVV = 0.214777
WJets = 0.000000
DY = 0.000000
singleTop = 20.507983
TX = 3.120045
QCD = 2.359110
background = 939.704393
```

1Tau1L

raw entries:

```
TTTT = 174076.000000
TT = 29033.000000
TTX = 32264.000000
VV = 8.000000
VVV = 28.000000
WJets = 0.000000
DY = 0.000000
singleTop = 5079.000000
TX = 5104.000000
QCD = 2.000000
background = 152.801445
```

1Tau1L

weighted:

```
TTTT = 1346.131770
TT = 3703240.690273
TTX = 37760.947894
VV = 880.436742
VVV = 2.192554
WJets = 0.000000
DY = 0.000000
singleTop = 237.583328
TX = 5025.851758
QCD = 2.174466
background = 2021.042269
```

1Tau1L

scaled to LUMI:

```
TTTT = 7.374862
TT = 1869.933258
TTX = 105.288623
VV = 0.111525
VVV = 0.293919
WJets = 0.000000
DY = 0.000000
singleTop = 36.331883
TX = 6.723952
QCD = 2.359110
background = 2021.042269
```

Event Yield

1Tau2OS

raw entries:

```
TTTT = 23961.000000
TT = 643.000000
TTX = 4050.000000
VV = 0.000000
VVV = 4.000000
WJets = 0.000000
DY = 0.000000
singleTop = 1971.000000
TX = 544.000000
QCD = 0.000000
background = 16.543800
```

1Tau2SS

raw entries:

```
TTTT = 12092.000000
TT = 27.000000
TTX = 1389.000000
VV = 0.000000
VVV = 2.000000
WJets = 0.000000
DY = 0.000000
singleTop = 315.000000
TX = 256.000000
QCD = 0.000000
background = 4.544995
```

1Tau2L

raw entries:

```
TTTT = 36053.000000
TT = 670.000000
TTX = 5439.000000
VV = 0.000000
VVV = 6.000000
WJets = 0.000000
DY = 0.000000
singleTop = 2286.000000
TX = 800.000000
QCD = 0.000000
background = 21.088795
```

1Tau2OS

weighted:

```
TTTT = 182.618180
TT = 46463.399858
TTX = 4118.349976
VV = 0.000000
VVV = 0.584920
WJets = 0.000000
DY = 0.000000
singleTop = 99.430589
TX = 545.692495
QCD = 0.000000
background = 40.979358
```

1Tau2SS

weighted:

```
TTTT = 94.395558
TT = 2853.860295
TTX = 1564.260273
VV = 0.000000
VVV = 0.140281
WJets = 0.000000
DY = 0.000000
singleTop = 15.340105
TX = 253.566127
QCD = 0.000000
background = 5.858035
```

1Tau2L

weighted:

```
TTTT = 277.013738
TT = 49317.260154
TTX = 5682.610249
VV = 0.000000
VVV = 0.725201
WJets = 0.000000
DY = 0.000000
singleTop = 114.770694
TX = 799.258622
QCD = 0.000000
background = 45.837393
```

1Tau2OS

scaled to LUMI:

```
TTTT = 1.000484
TT = 29.721410
TTX = 10.264518
VV = 0.000000
VVV = 0.085810
WJets = 0.000000
DY = 0.000000
singleTop = 0.253072
TX = 0.654548
QCD = 0.000000
background = 40.979358
```

1Tau2SS

scaled to LUMI:

```
TTTT = 0.517152
TT = 1.522051
TTX = 3.975329
VV = 0.000000
VVV = 0.020403
WJets = 0.000000
DY = 0.000000
singleTop = 0.039044
TX = 0.301209
QCD = 0.000000
background = 5.858035
```

1Tau2L

scaled to LUMI:

```
TTTT = 1.517636
TT = 31.243461
TTX = 14.239847
VV = 0.000000
VVV = 0.106212
WJets = 0.000000
DY = 0.000000
singleTop = 0.292115
TX = 0.955757
QCD = 0.000000
background = 46.837393
```

Event Yield

2Tau1E

raw entries:

```
TTTT = 2180.000000
TT = 84.000000
TTX = 1025.000000
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 267.000000
TX = 230.000000
QCD = 0.000000
background = 3.241680
```

2Tau1Mu

raw entries:

```
TTTT = 2774.000000
TT = 98.000000
TTX = 1122.000000
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 264.000000
TX = 273.000000
QCD = 0.000000
background = 3.476008
```

2Tau1L

raw entries:

```
TTTT = 4954.000000
TT = 182.000000
TTX = 2147.000000
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 531.000000
TX = 503.000000
QCD = 0.000000
background = 6.717688
```

2Tau1E

weighted:

```
TTTT = 16.596552
TT = 8862.153584
TTX = 1066.149400
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 27.158919
TX = 225.444790
QCD = 0.000000
background = 7.559703
```

2Tau1Mu

weighted:

```
TTTT = 21.142630
TT = 11436.690755
TTX = 1174.287908
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 12.408789
TX = 3254.78
QCD = 0.000000
background = 8.960338
```

2Tau1L

weighted:

```
TTTT = 37.739382
TT = 20298.844339
TTX = 2240.437308
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 39.567708
TX = 487.770268
QCD = 0.000000
background = 15.520041
```

2Tau1E

scaled to LUMI:

```
TTTT = 0.090925
TT = 4.823582
TTX = 2.390926
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 0.069125
TX = 0.276070
QCD = 0.000000
background = 7.559703
```

2Tau1Mu

scaled to LUMI:

```
TTTT = 0.115832
TT = 5.929230
TTX = 2.675061
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 0.031583
TX = 0.324465
QCD = 0.000000
background = 8.960338
```

2Tau1L

scaled to LUMI:

```
TTTT = 0.206757
TT = 10.752811
TTX = 5.065987
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 0.100708
TX = 0.600535
QCD = 0.000000
background = 15.520041
```

Event Yield

2Tau2OS

raw entries:

```
TTTT = 353.000000
TT = 2.000000
TTX = 119.000000
VV = 0.000000
VVV = 1.000000
WJets = 0.000000
DY = 0.000000
singleTop = 4.000000
TX = 36.000000
QCD = 0.000000
background = 0.457729
```

2Tau2OS

weighted:

```
TTTT = 2.088281
TT = 142.350423
TTX = 117.081043
VV = 0.000000
vvv = 0.018778
WJets = 0.000000
DY = 0.000000
singleTop = 0.869543
TX = 36.226800
QCD = 0.000000
background = 0.395161
```

2Tau2OS

scaled to LUMI:

```
TTTT = 0.011441
TT = 0.091864
TTX = 0.259295
VV = 0.000000
vvv = 0.002693
WJets = 0.000000
DY = 0.000000
singleTop = 0.002213
TX = 0.039095
QCD = 0.000000
background = 0.395161
```

2Tau2SS

raw entries:

```
TTTT = 147.000000
TT = 0.000000
TTX = 16.000000
VV = 0.000000
VVV = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 3.000000
TX = 5.000000
QCD = 0.000000
background = 0.041054
```

2Tau2SS

weighted:

```
TTTT = 1.359831
TT = 0.000000
TTX = 16.357750
VV = 0.000000
vvv = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 0.158186
TX = 4.6594
QCD = 0.000000
background = 0.033499
```

2Tau2SS

scaled to LUMI:

```
TTTT = 0.007450
TT = 0.000000
TTX = 0.028013
VV = 0.000000
vvv = 0.000000
WJets = 0.000000
DY = 0.000000
singleTop = 0.000403
TX = 0.005083
QCD = 0.000000
background = 0.033499
```

2Tau2L

raw entries:

```
TTTT = 500.000000
TT = 2.000000
TTX = 135.000000
VV = 0.000000
VVV = 1.000000
WJets = 0.000000
DY = 0.000000
singleTop = 7.000000
TX = 41.000000
QCD = 0.000000
background = 0.498783
```

2Tau2L

weighted:

```
TTTT = 3.448112
TT = 142.350423
TTX = 133.438793
VV = 0.000000
vvv = 0.018778
WJets = 0.000000
DY = 0.000000
singleTop = 0.1027728
TX = 41.042494
QCD = 0.000000
background = 0.428660
```

2Tau2L

scaled to LUMI:

```
TTTT = 0.018891
TT = 0.091864
TTX = 0.287308
VV = 0.000000
vvv = 0.002693
WJets = 0.000000
DY = 0.000000
singleTop = 0.002616
TX = 0.044179
QCD = 0.000000
background = 0.428660
```

Outline

1 BDT Overall Strategy

2 1Tau1L

3 1Tau2OS

4 2Tau1L

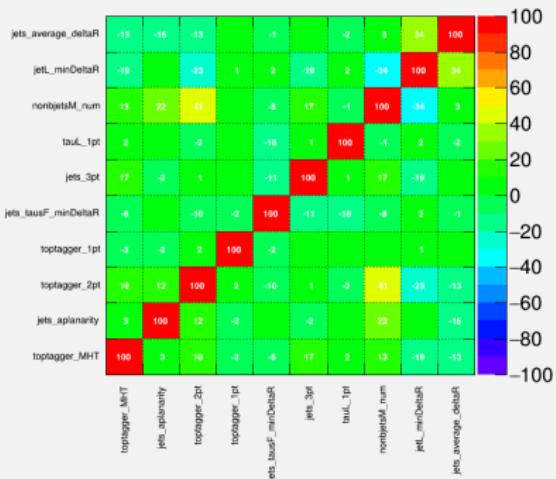
5 Event Yield

6 Results of all training

- 1tau2os
- 2tau1l

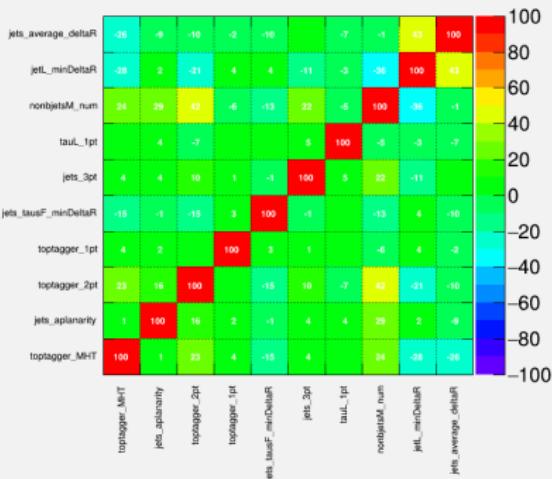
Correlation Matrix (signal)

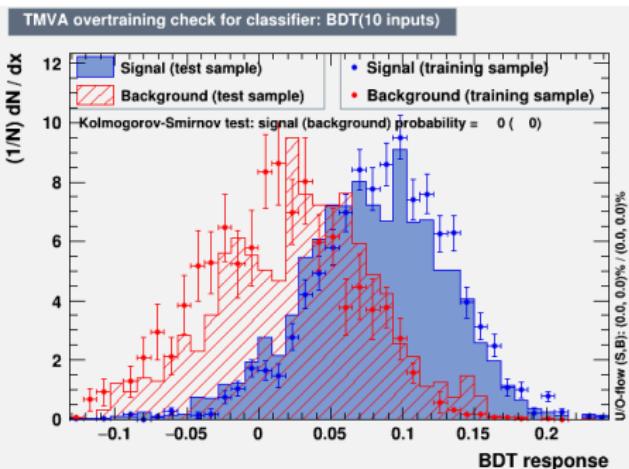
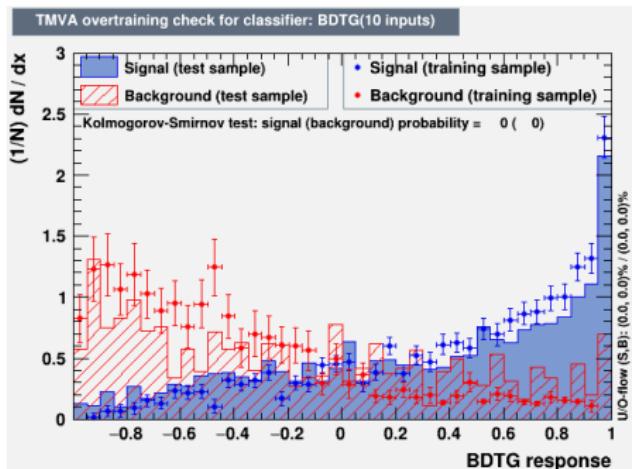
(10 input variables)



Correlation Matrix (background)

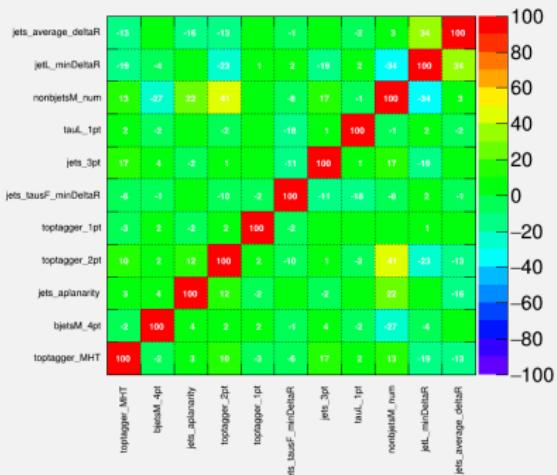
(10 input variables)





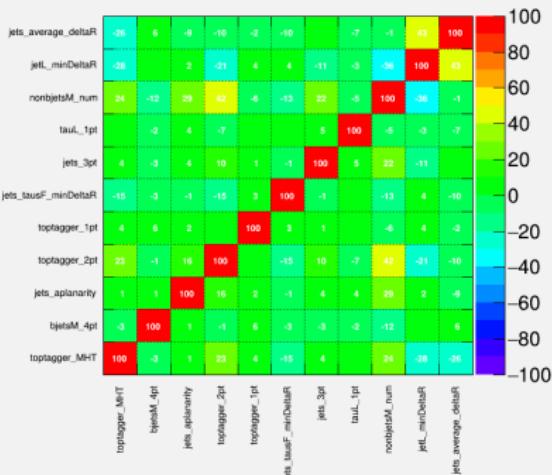
Correlation Matrix (signal)

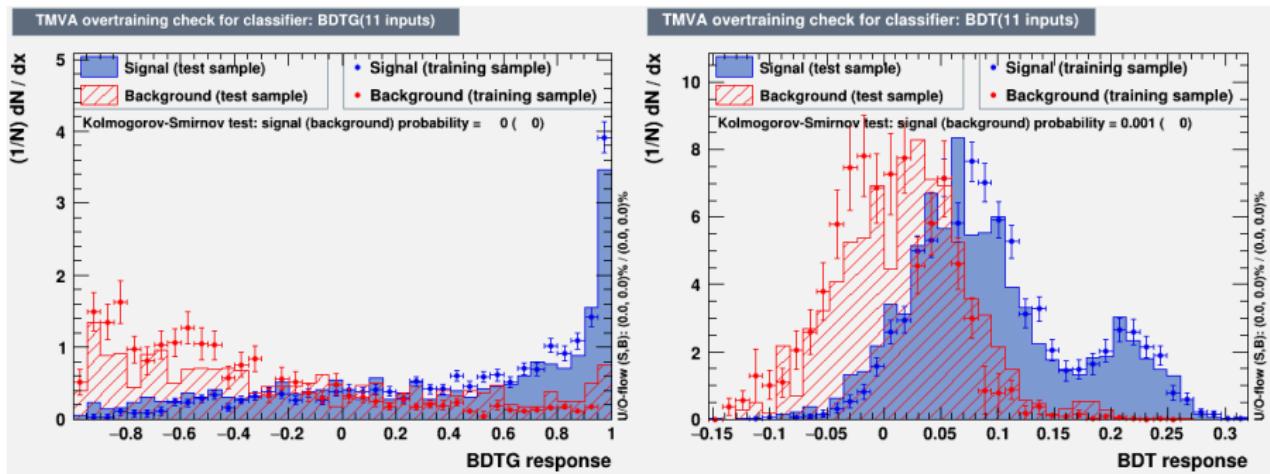
(11 input variables)



Correlation Matrix (background)

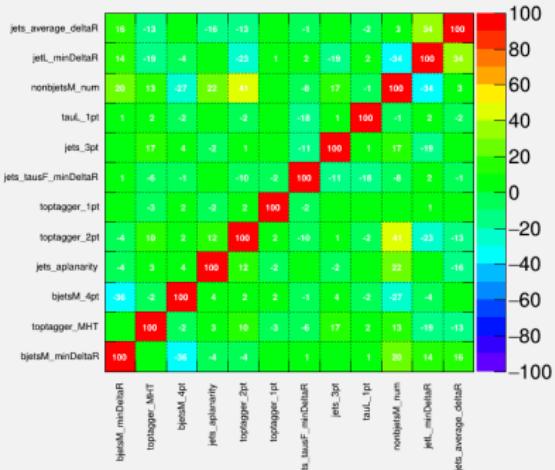
(11 input variables)





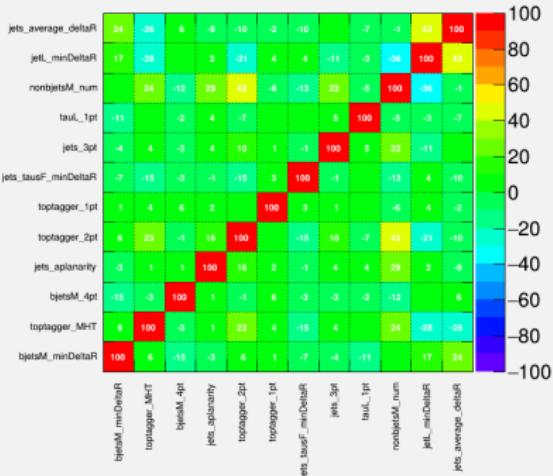
Correlation Matrix (signal)

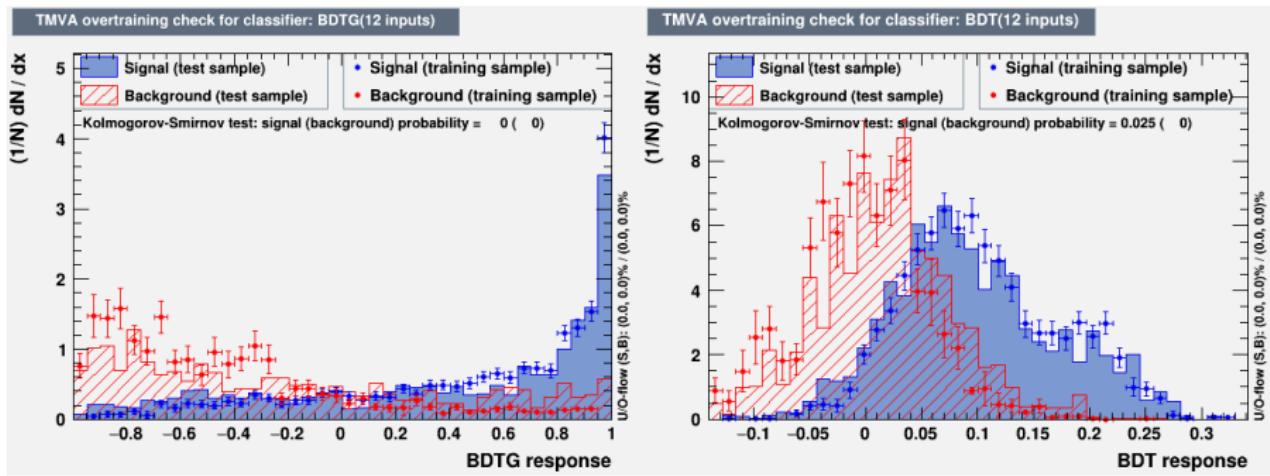
(12 input variables)



Correlation Matrix (background)

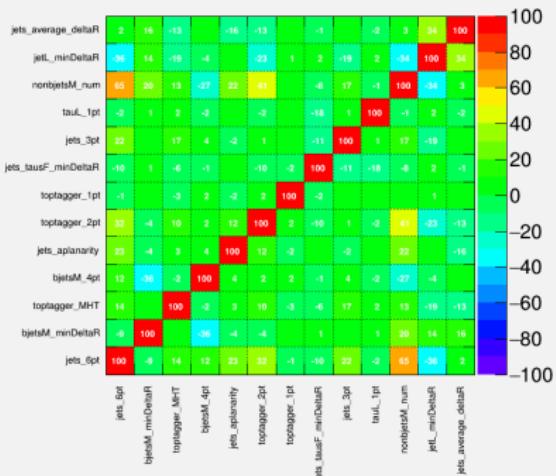
(12 input variables)





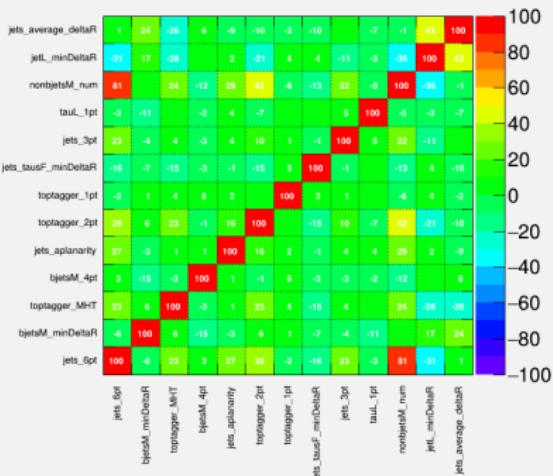
Correlation Matrix (signal)

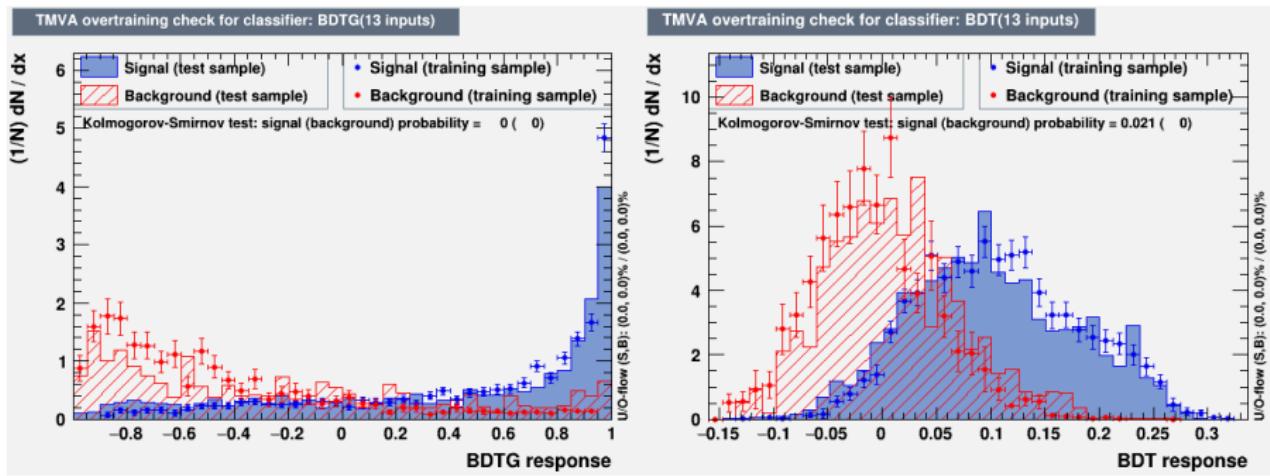
(13 input variables)



Correlation Matrix (background)

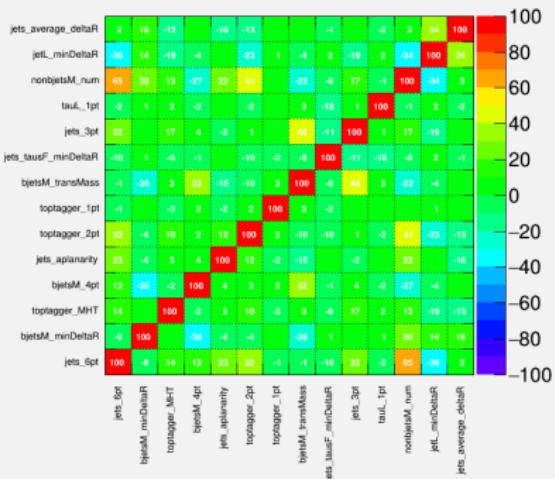
(13 input variables)





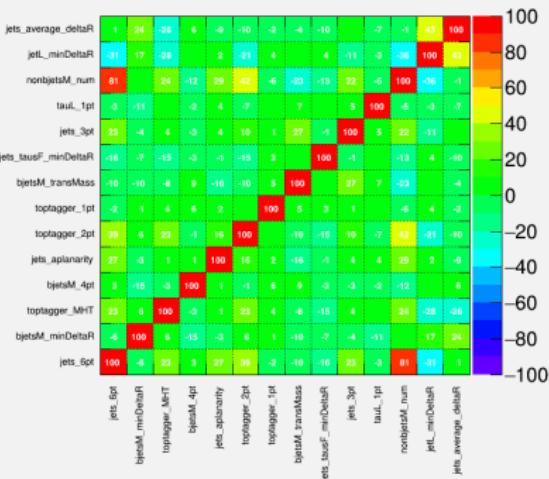
Correlation Matrix (signal)

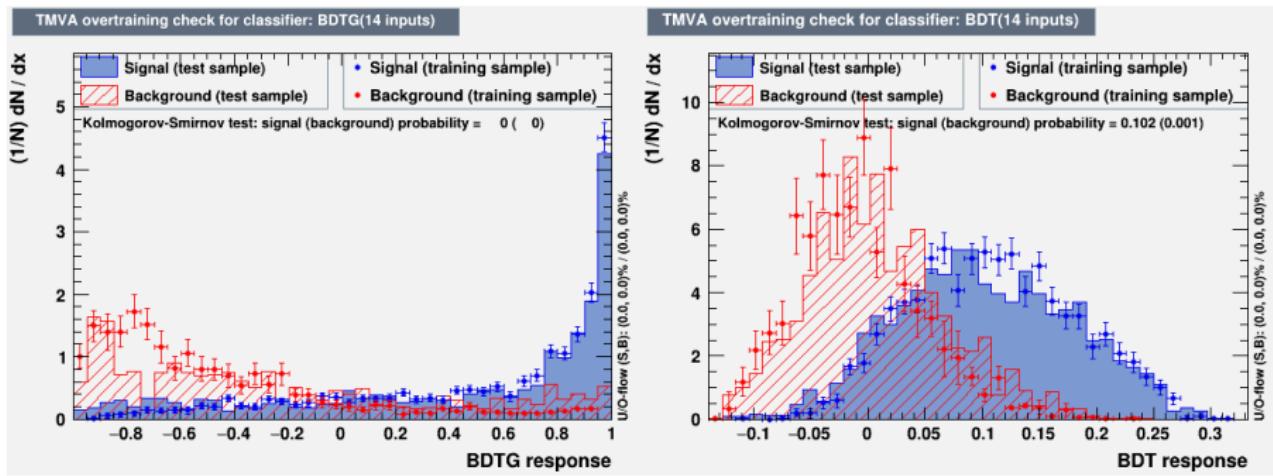
(14 input variables)



Correlation Matrix (background)

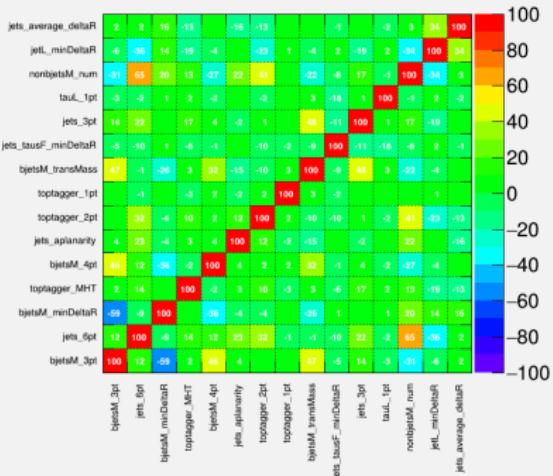
(14 input variables)





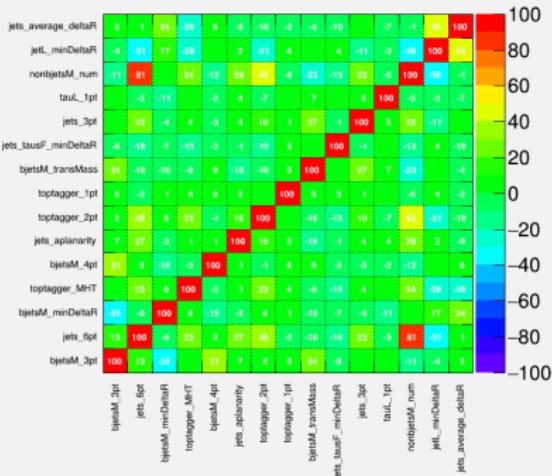
Correlation Matrix (signal)

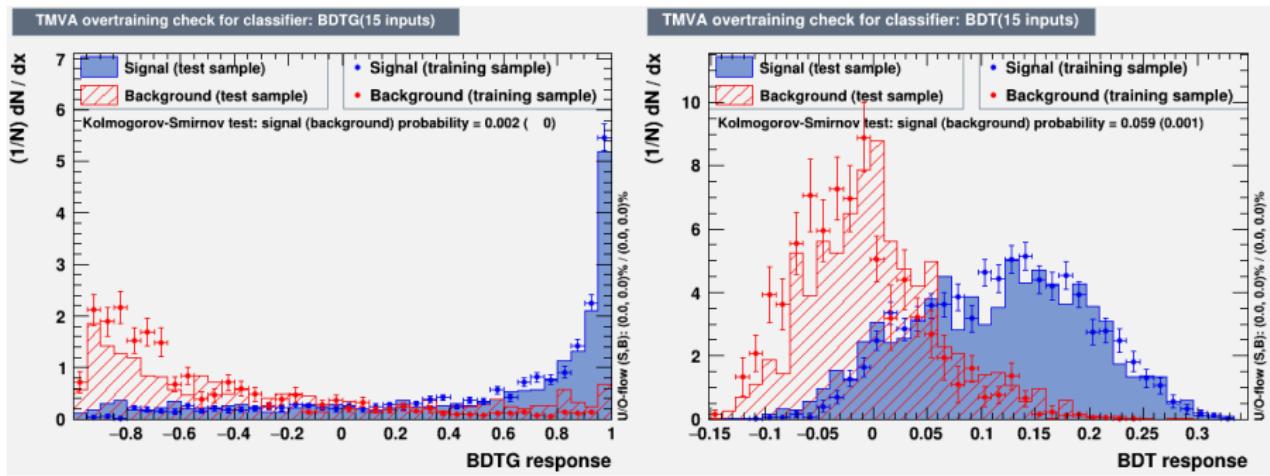
(15 input variables)



Correlation Matrix (background)

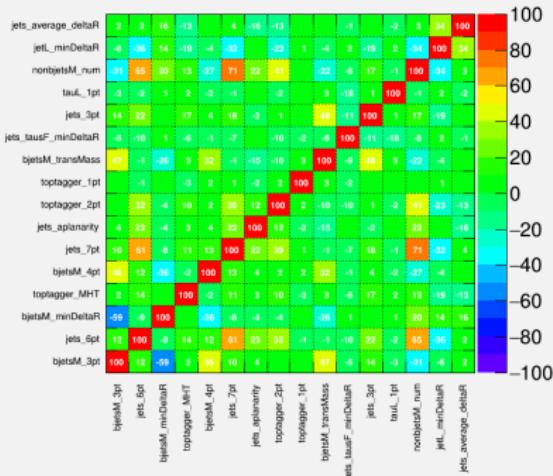
(15 input variables)





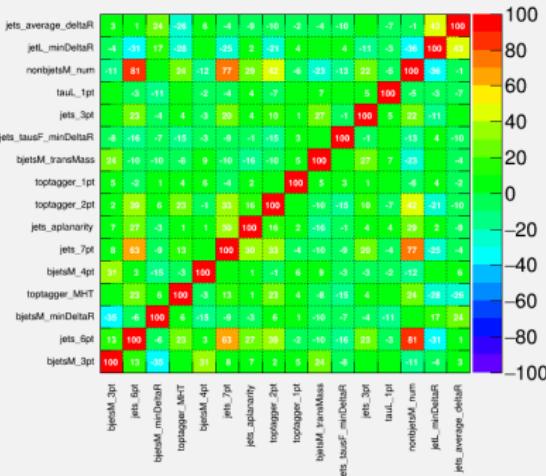
Correlation Matrix (signal)

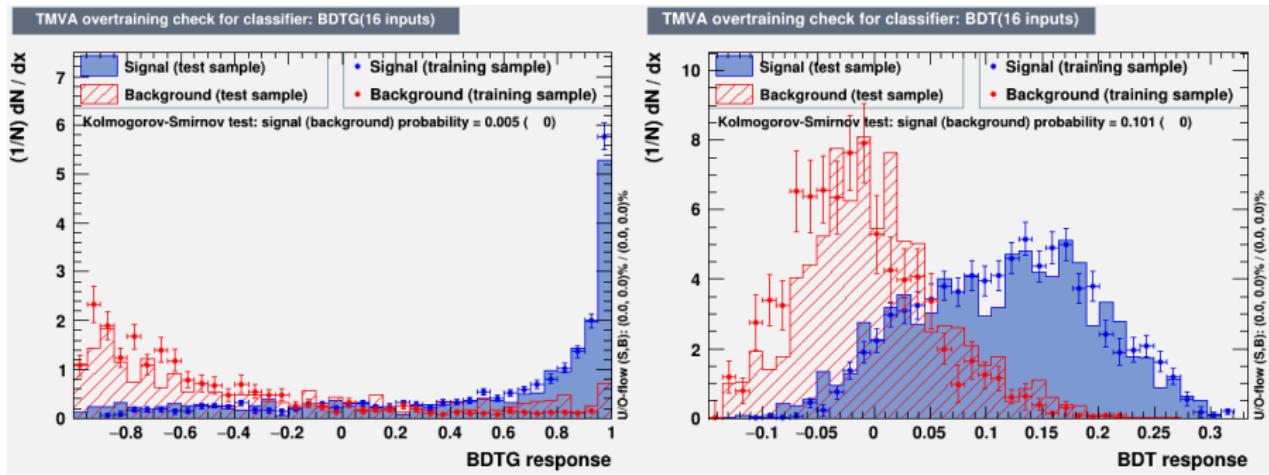
(16 input variables)



Correlation Matrix (background)

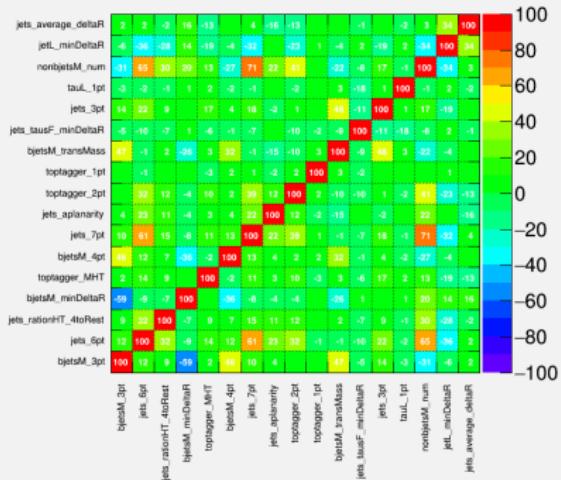
(16 input variables)





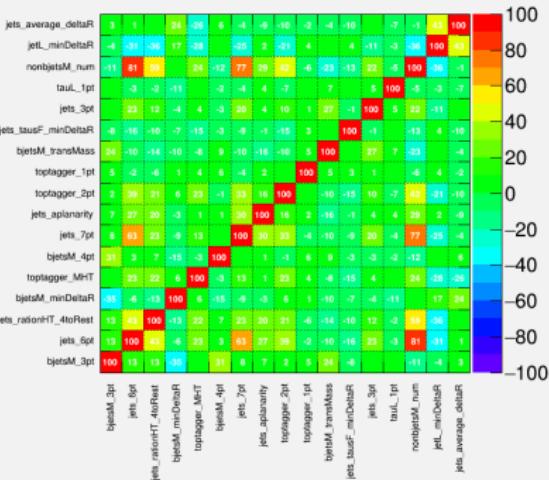
Correlation Matrix (signal)

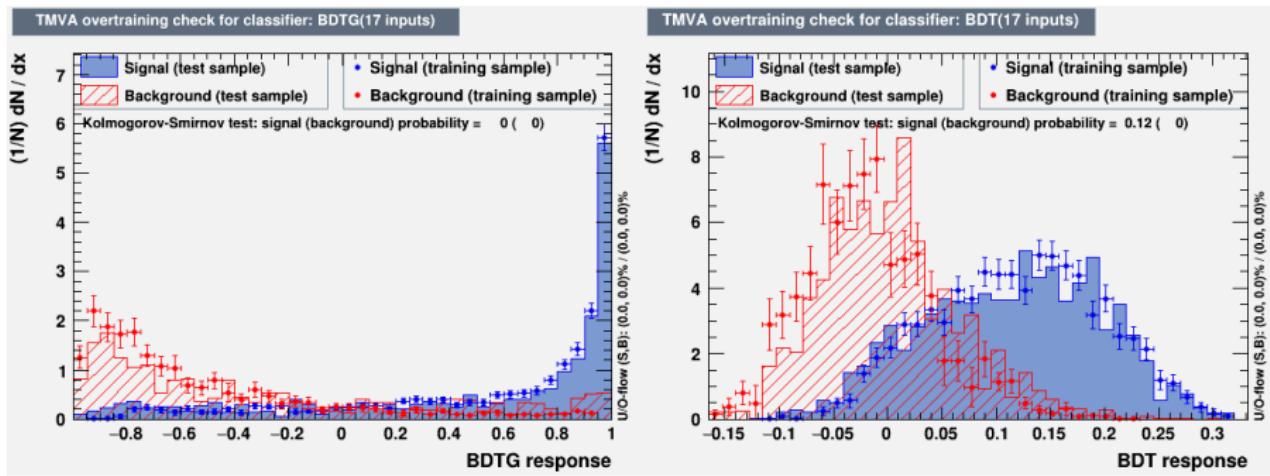
(17 input variables)



Correlation Matrix (background)

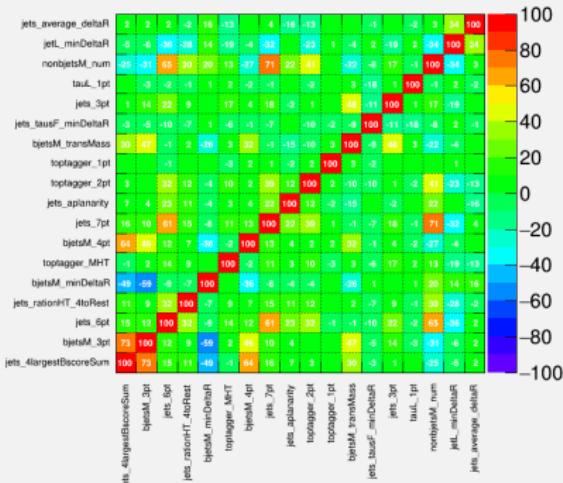
(17 input variables)





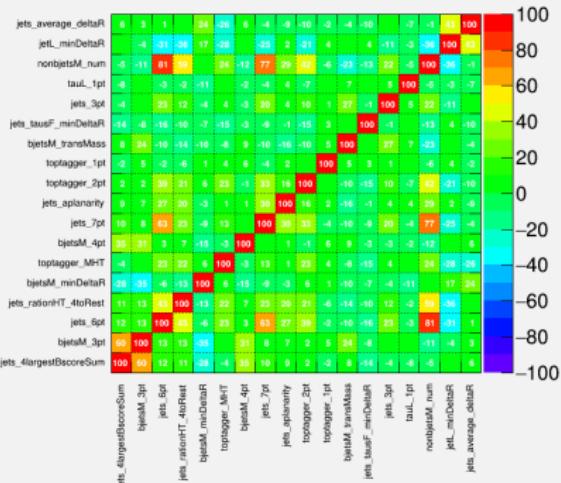
Correlation Matrix (signal)

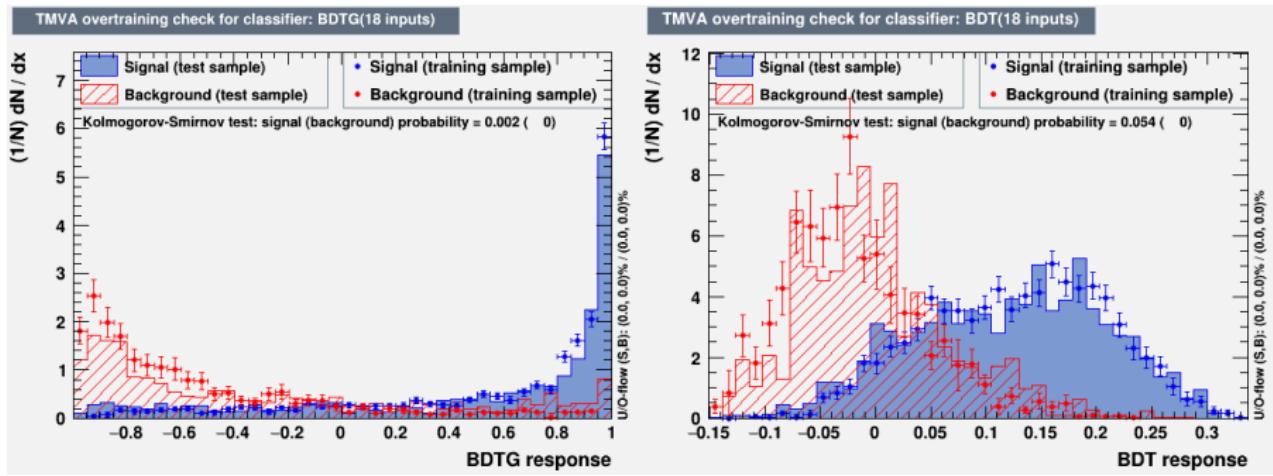
(18 input variables)



Correlation Matrix (background)

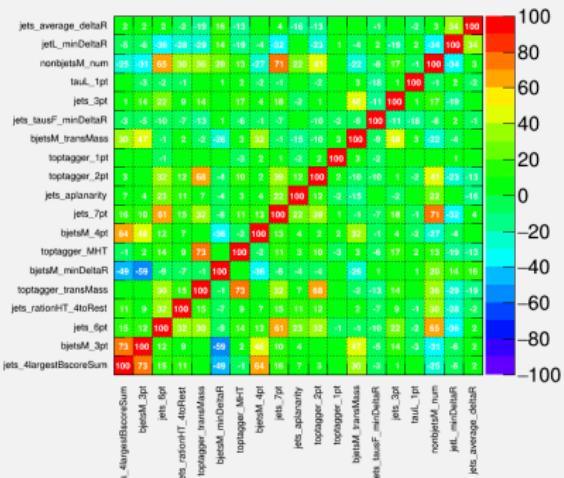
(18 input variables)





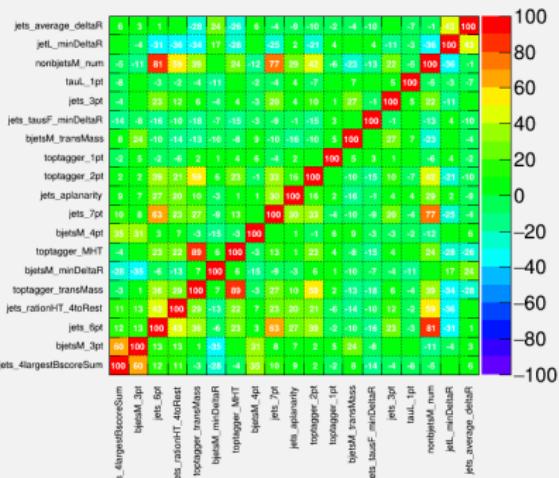
Correlation Matrix (signal)

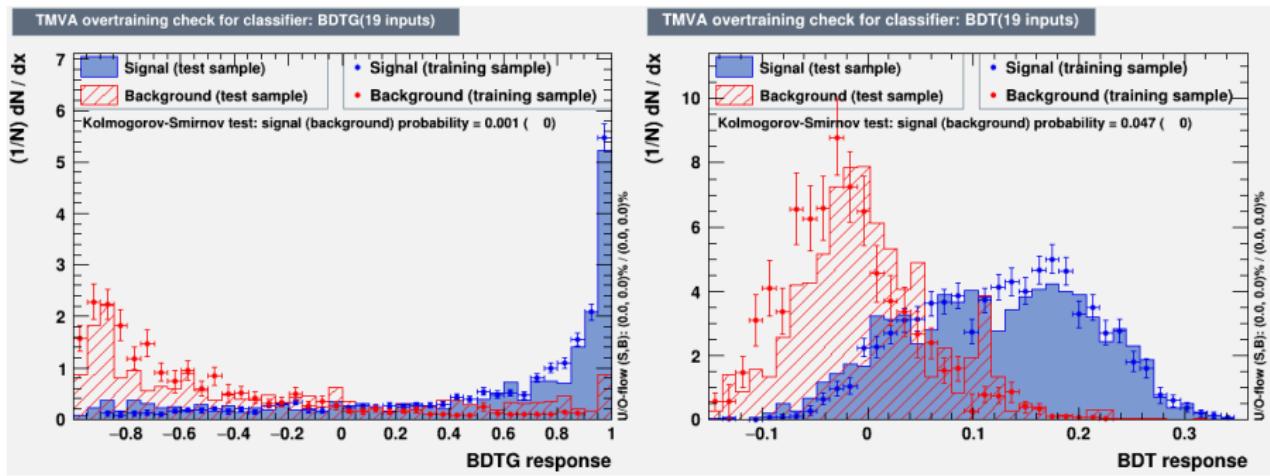
(19 input variables)



Correlation Matrix (background)

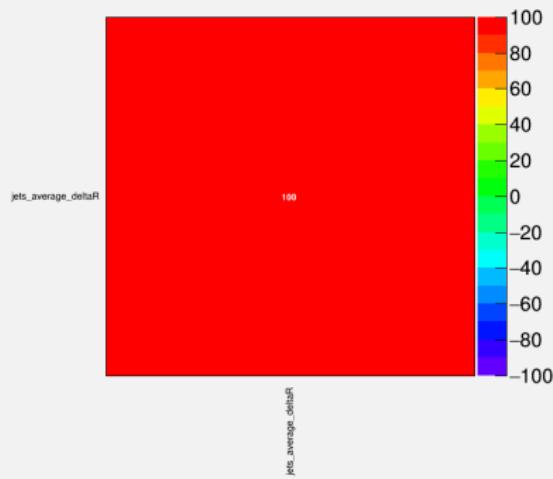
(19 input variables)



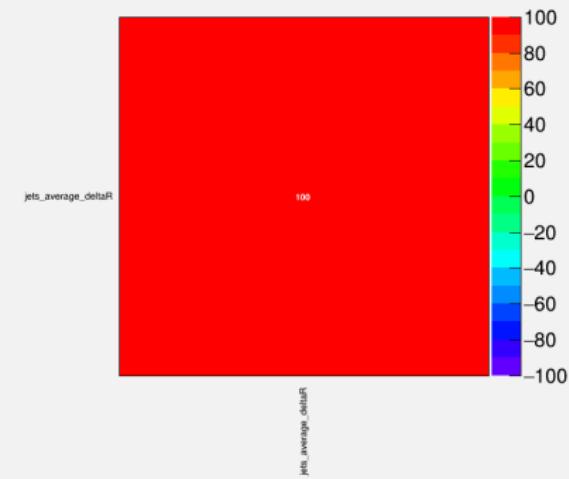


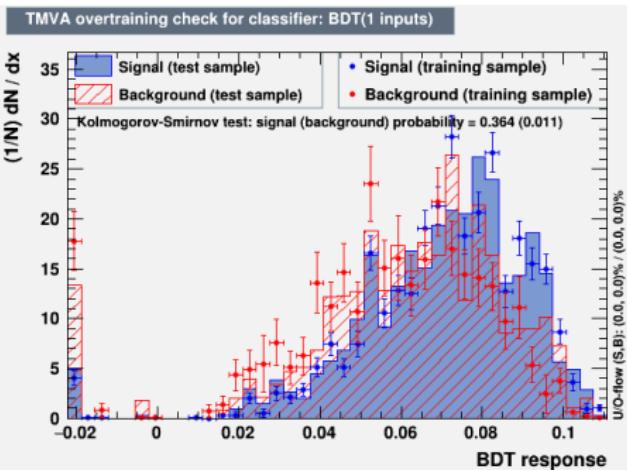
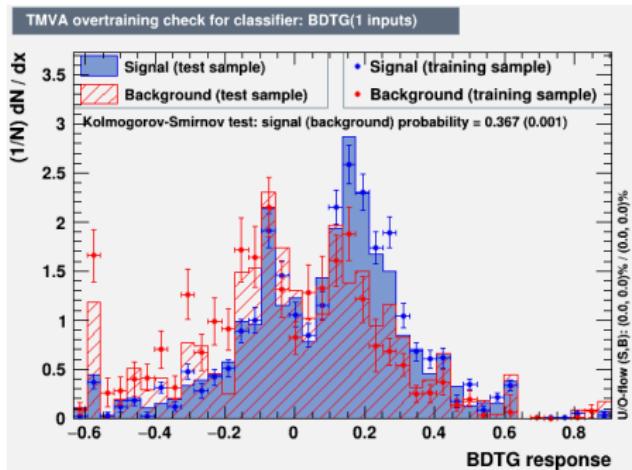
Correlation Matrix (signal)

(1 input variables)

**Correlation Matrix (background)**

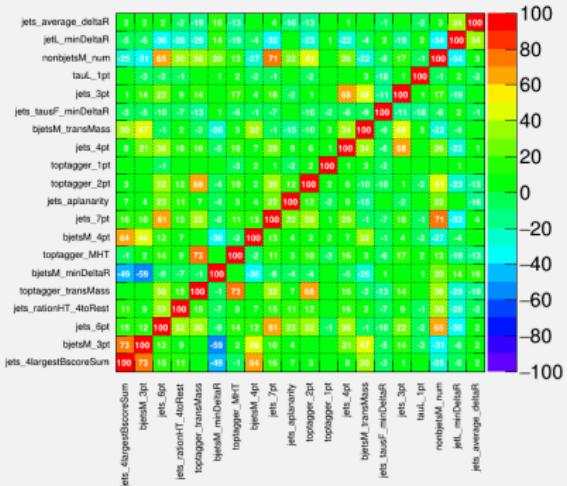
(1 input variables)





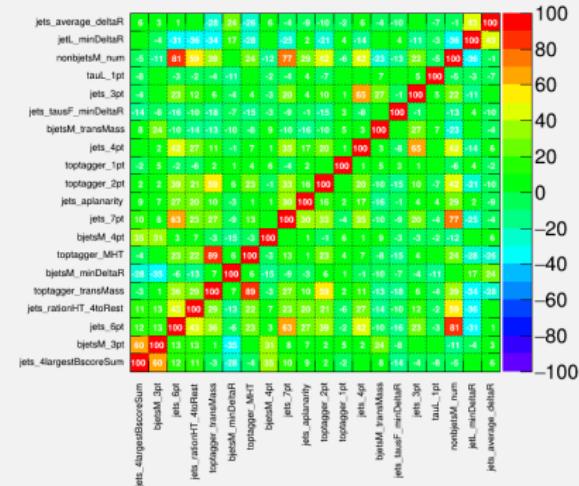
Correlation Matrix (signal)

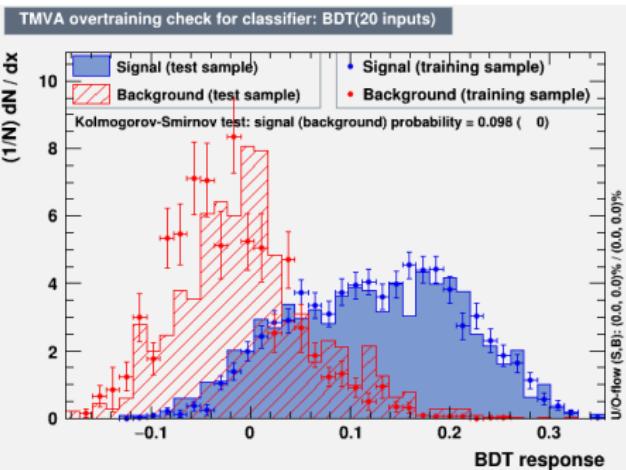
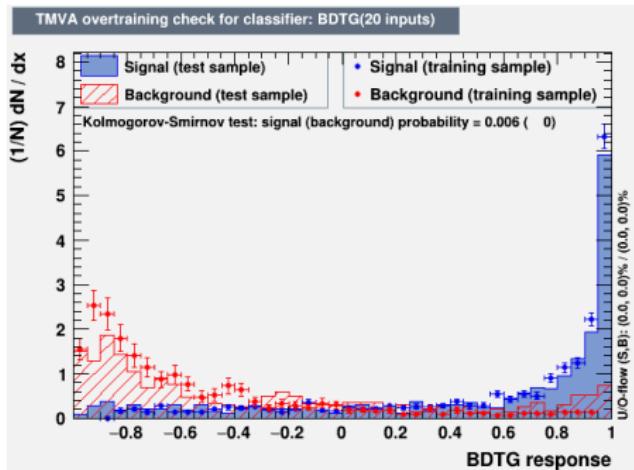
(20 input variables)



Correlation Matrix (background)

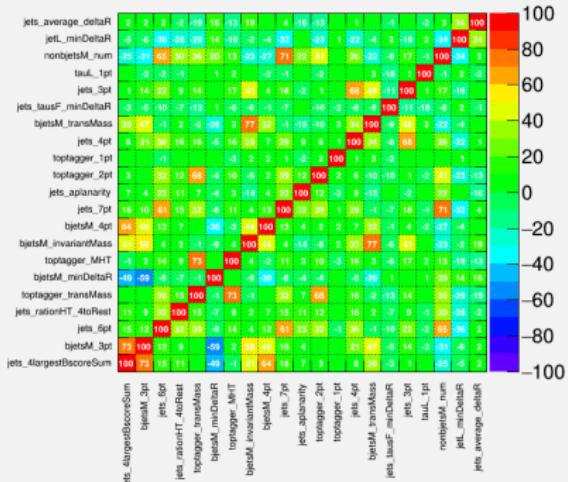
(20 input variables)





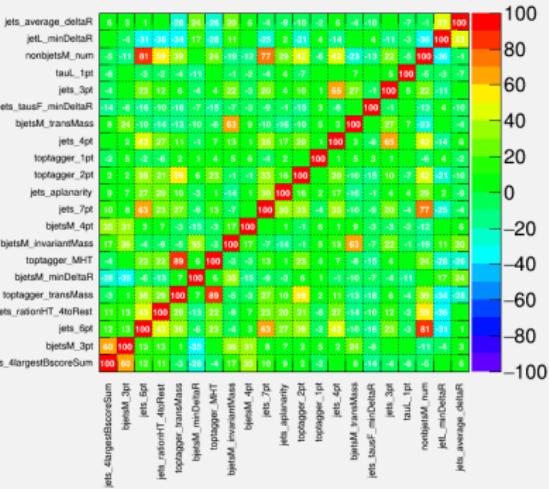
Correlation Matrix (signal)

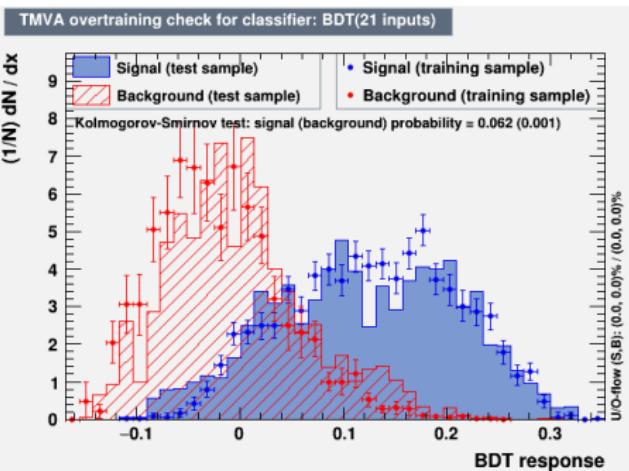
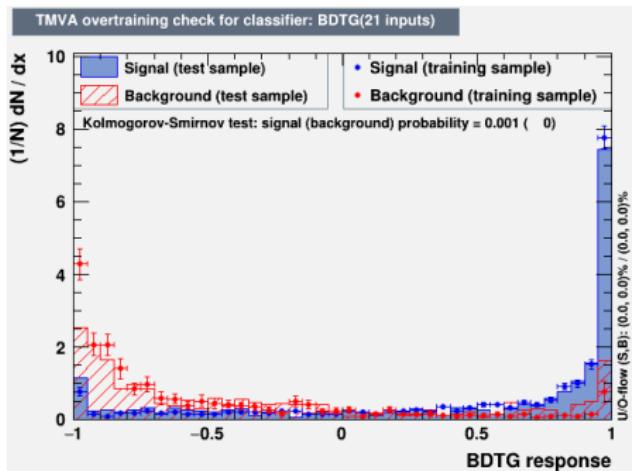
(21 input variables)



Correlation Matrix (background)

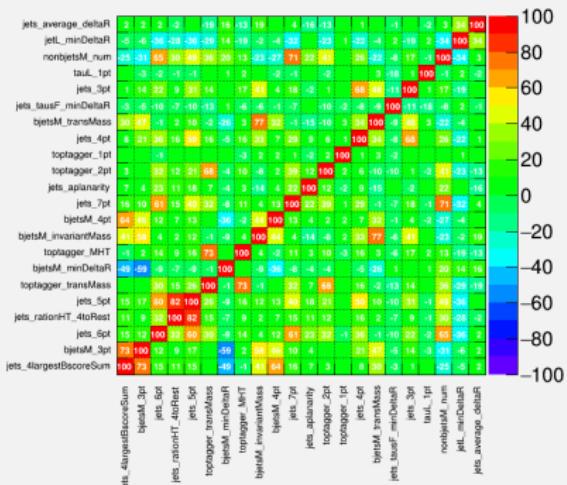
(21 input variables)





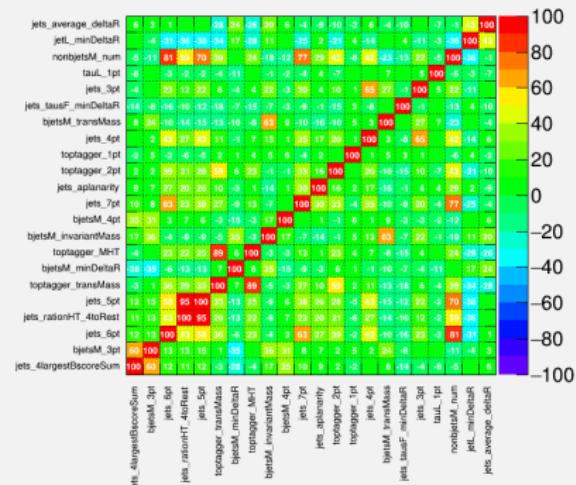
Correlation Matrix (signal)

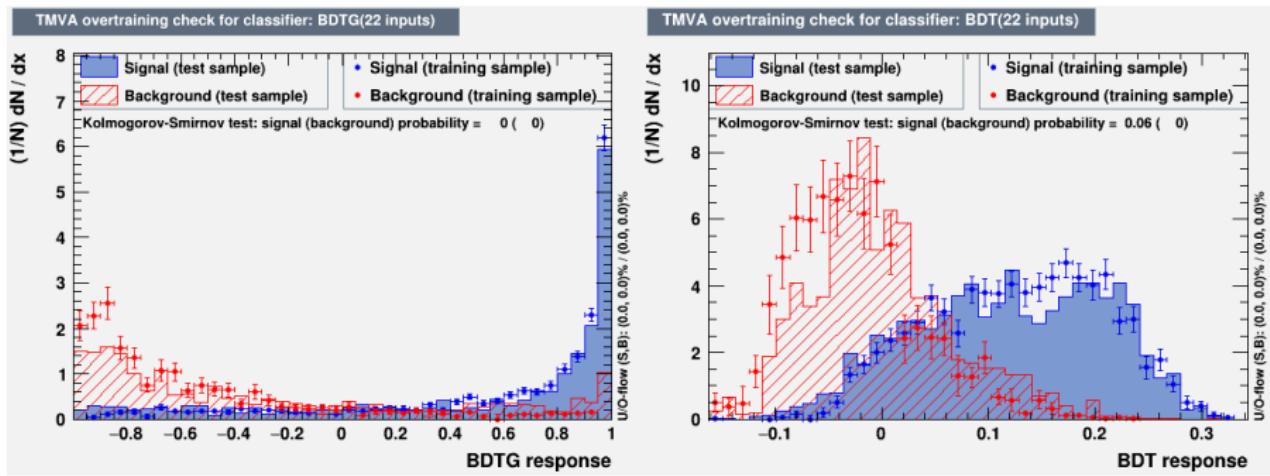
(22 input variables)



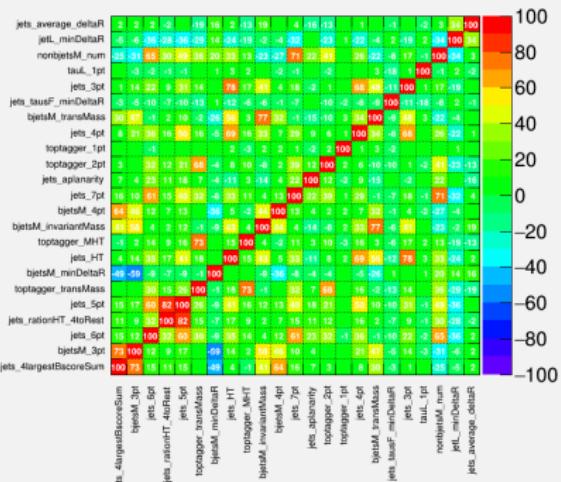
Correlation Matrix (background)

(22 input variables)

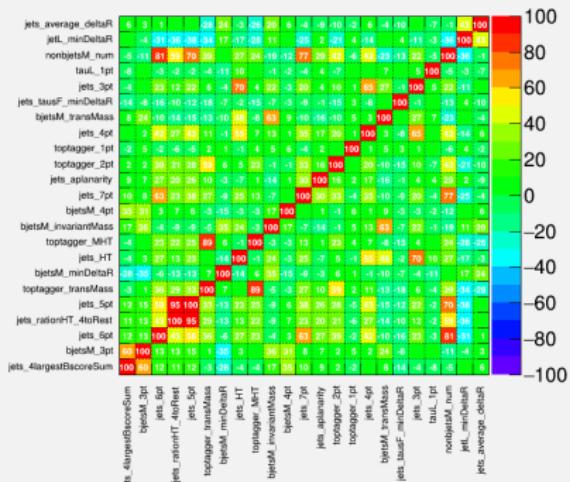


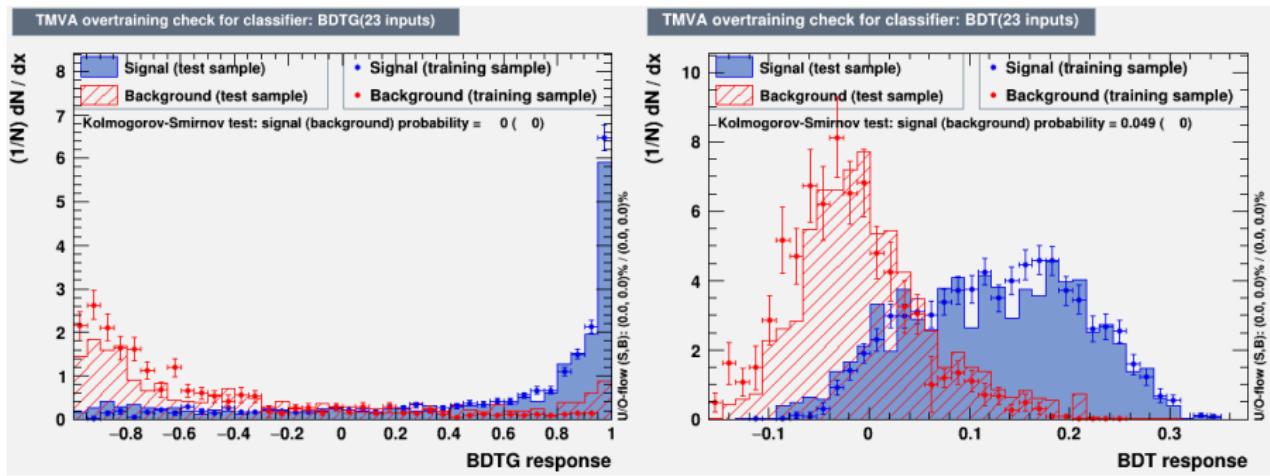


Correlation Matrix (signal)



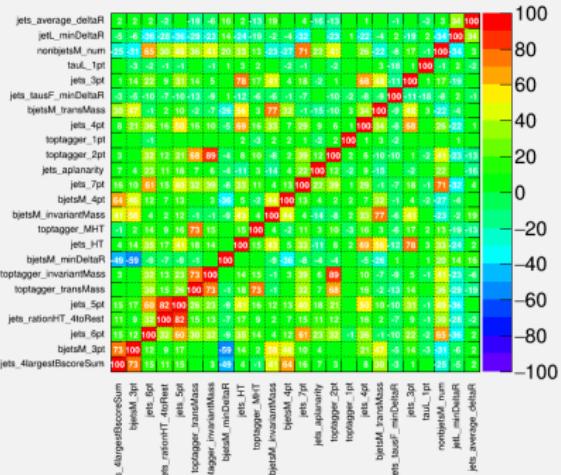
Correlation Matrix (background)





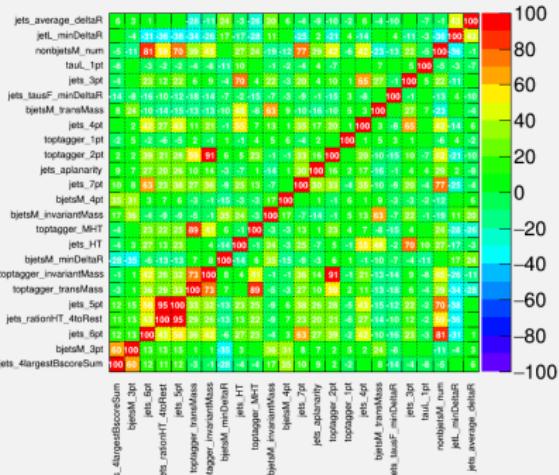
Correlation Matrix (signal)

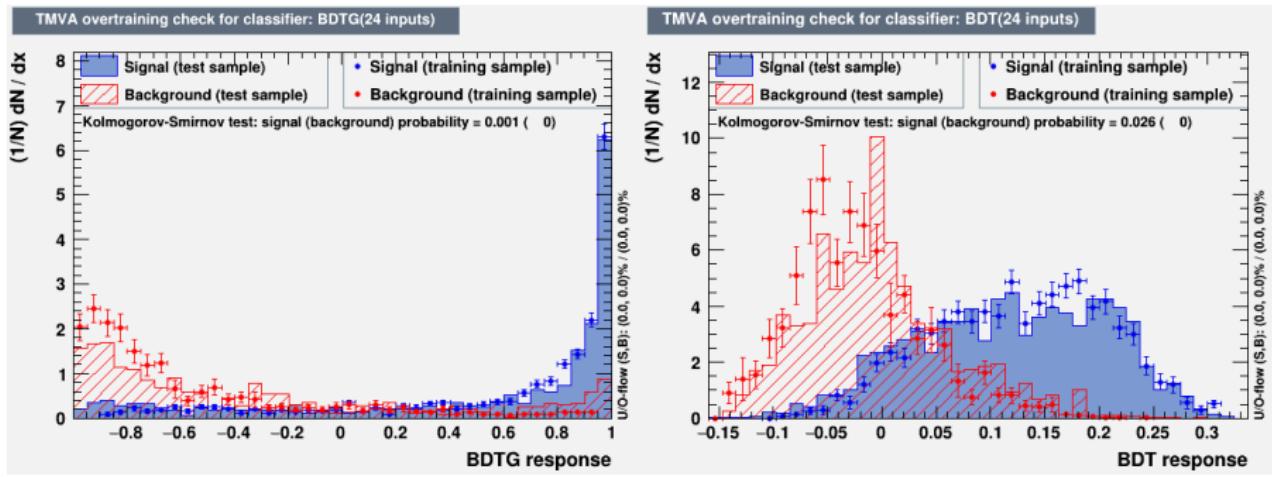
(24 input variables)



Correlation Matrix (background)

(24 input variables)



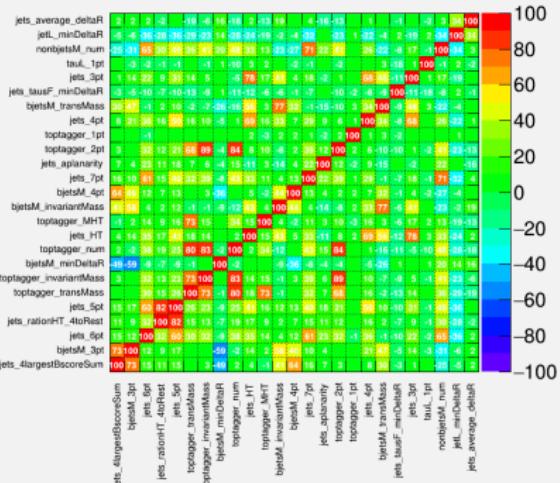


Results of all training

1tau2os

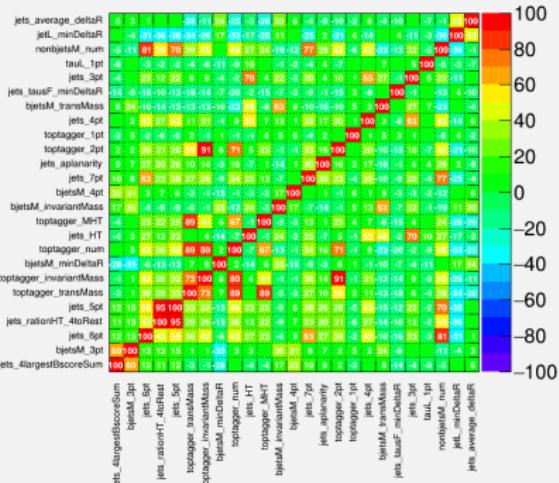
Correlation Matrix (signal)

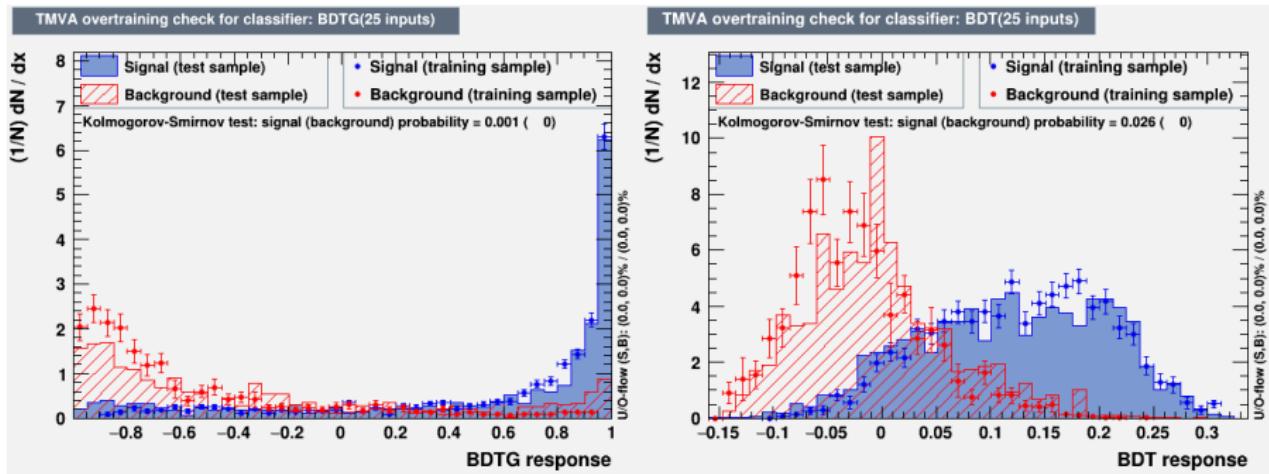
(25 input variables)



Correlation Matrix (background)

(25 input variables)



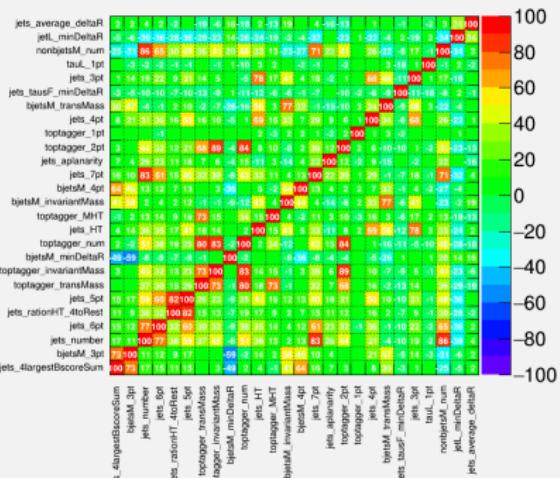


Results of all training

1tau2os

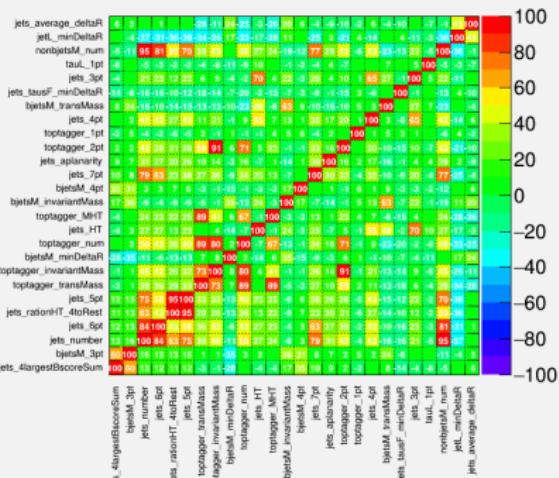
Correlation Matrix (signal)

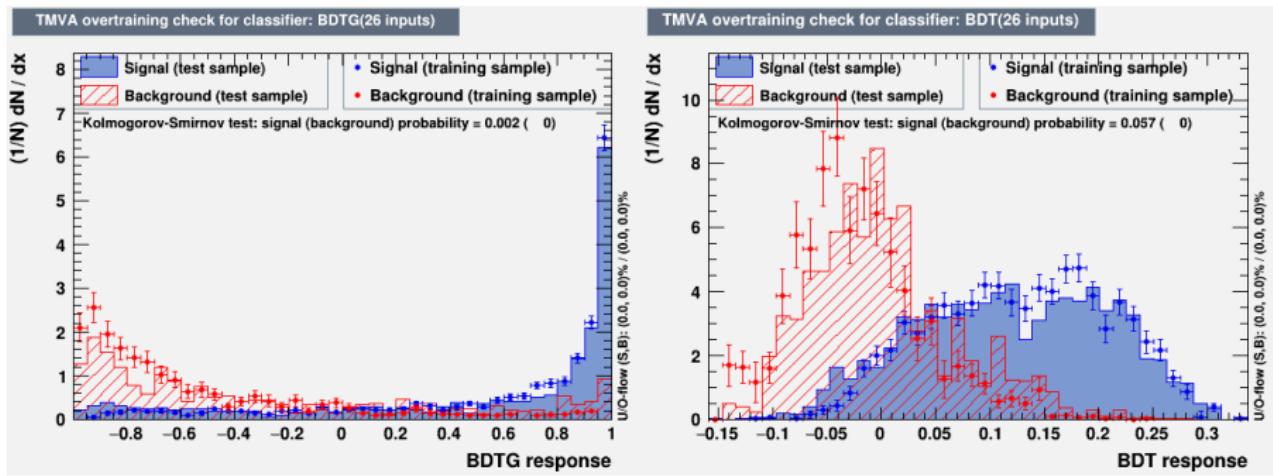
(26 input variables)



Correlation Matrix (background)

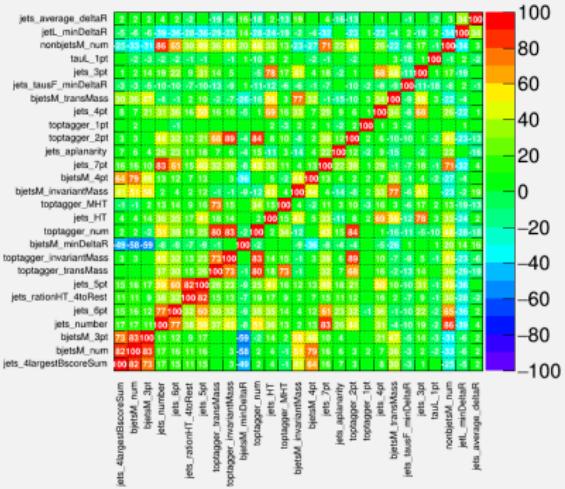
(26 input variables)





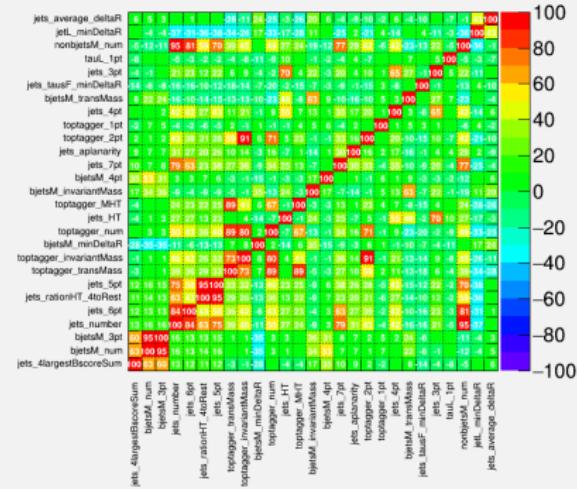
Correlation Matrix (signal)

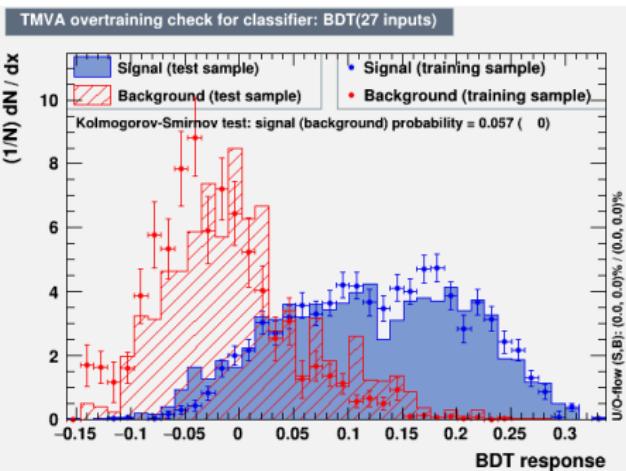
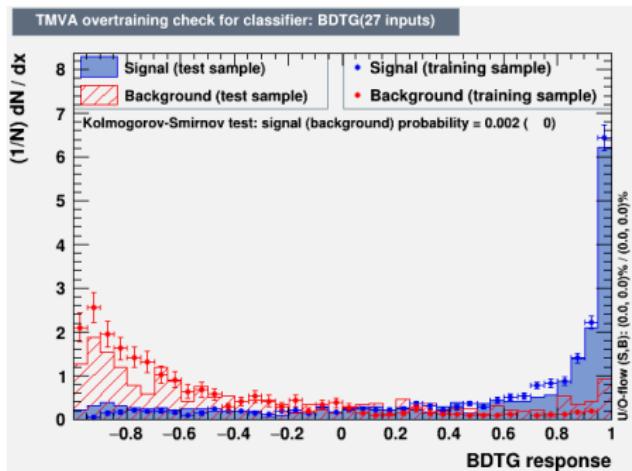
(27 input variables)



Correlation Matrix (background)

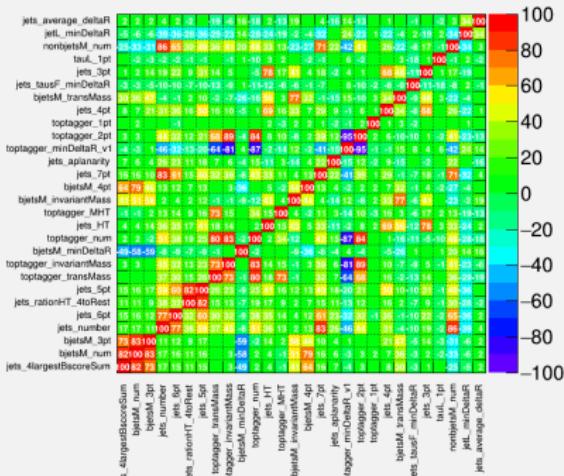
(27 input variables)





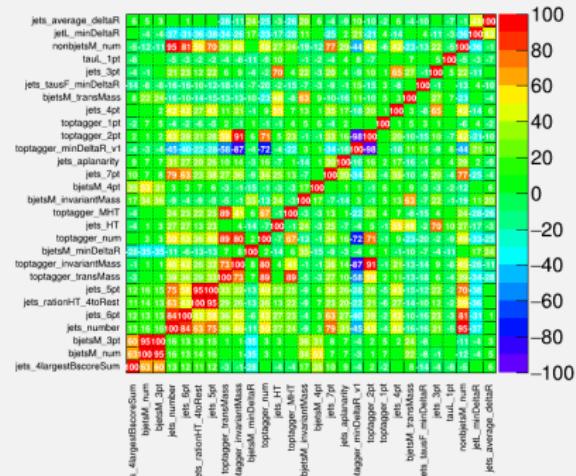
Correlation Matrix (signal)

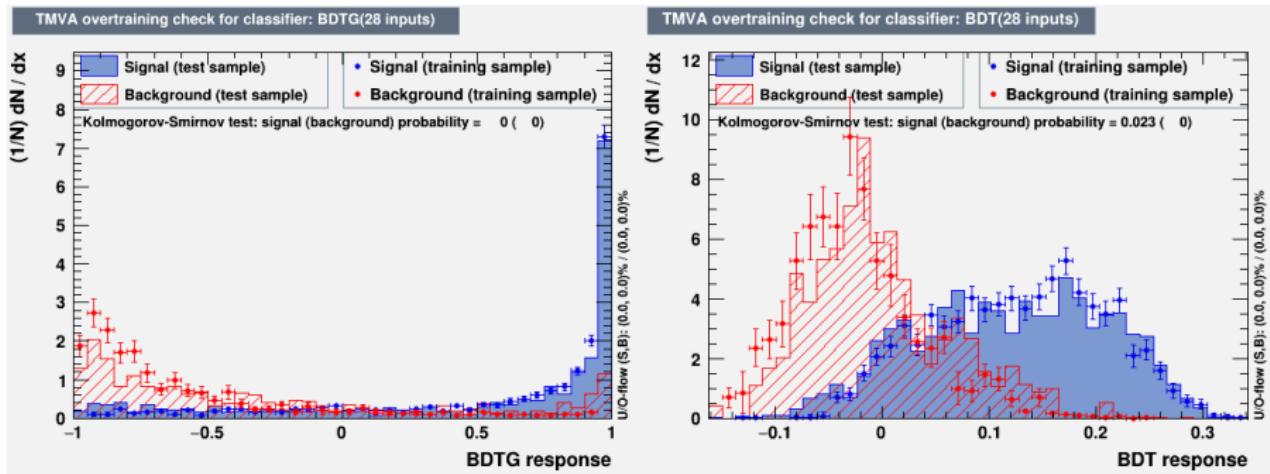
(28 input variables)



Correlation Matrix (background)

(28 input variables)



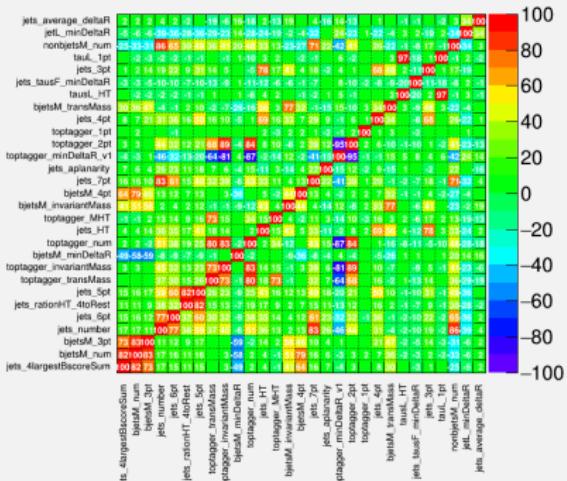


Results of all training

1tau2os

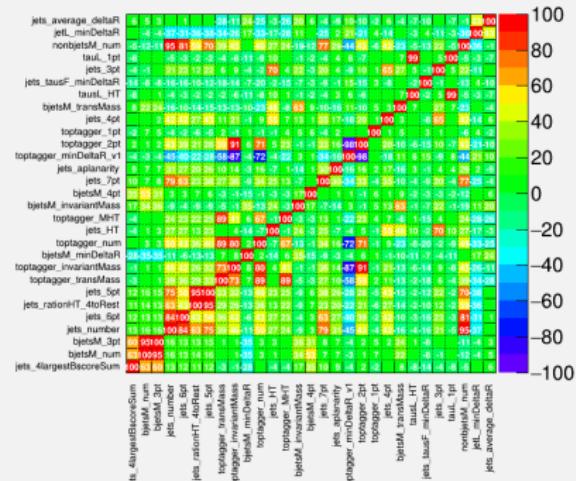
Correlation Matrix (signal)

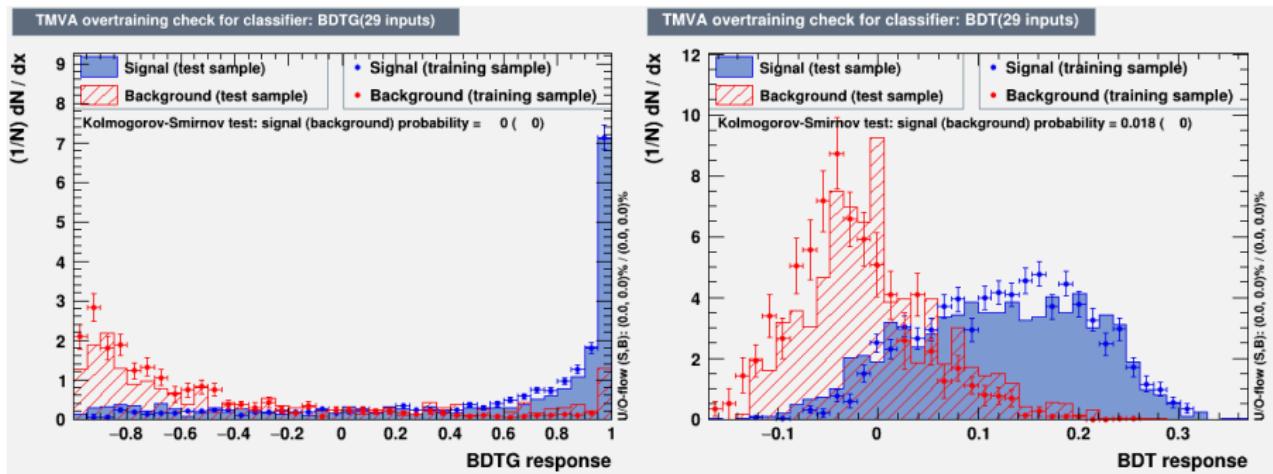
(29 input variables)



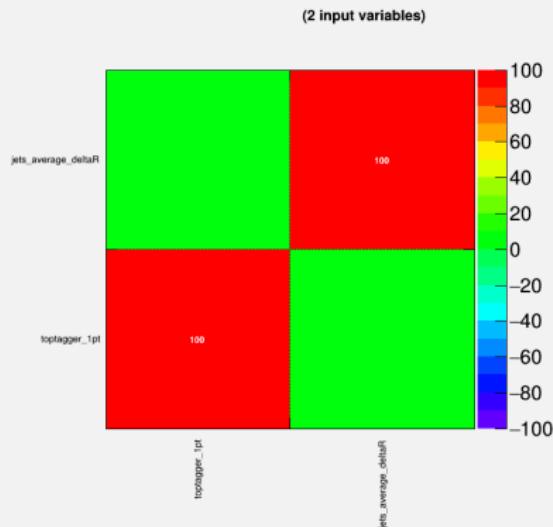
Correlation Matrix (background)

(29 input variables)

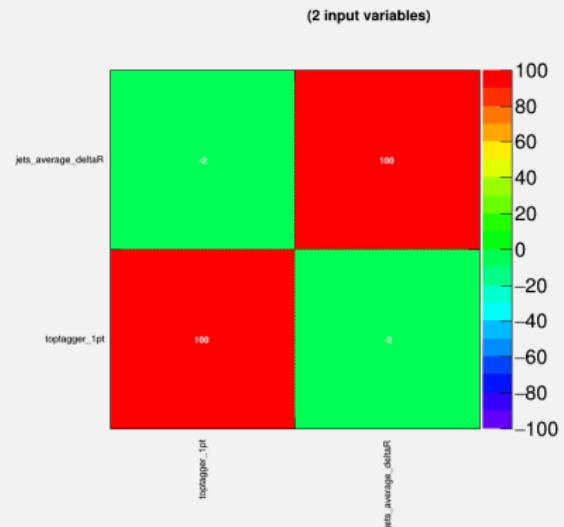


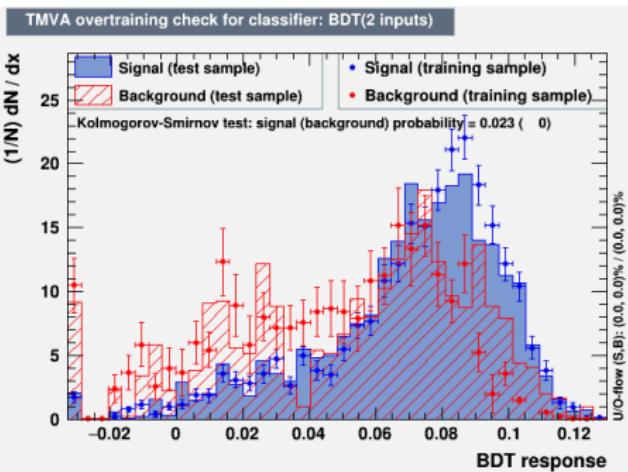
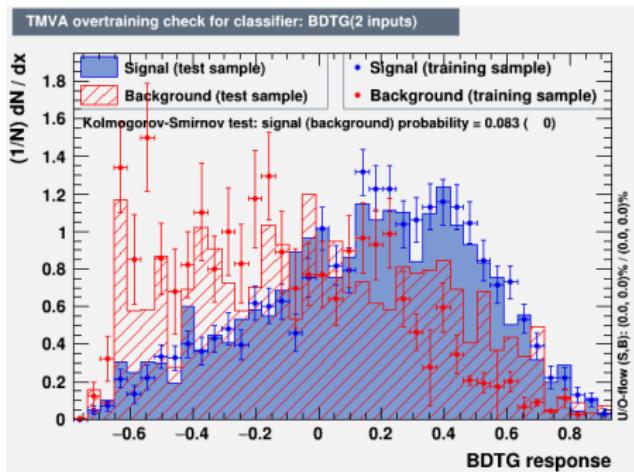


Correlation Matrix (signal)



Correlation Matrix (background)



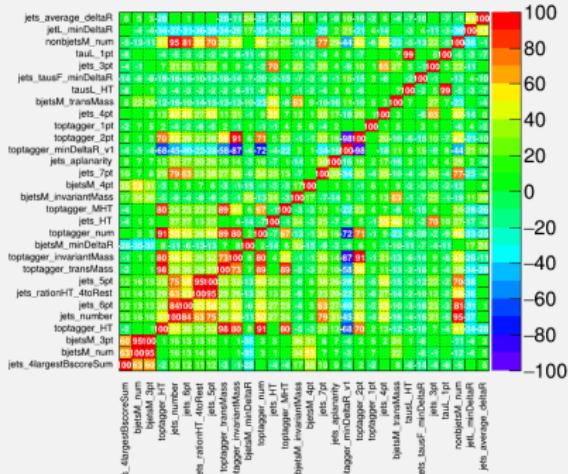
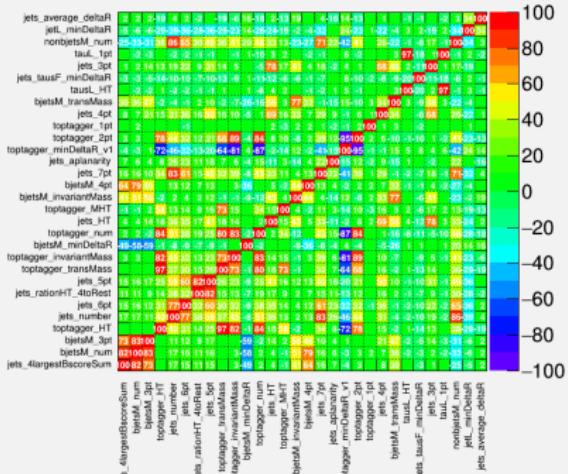


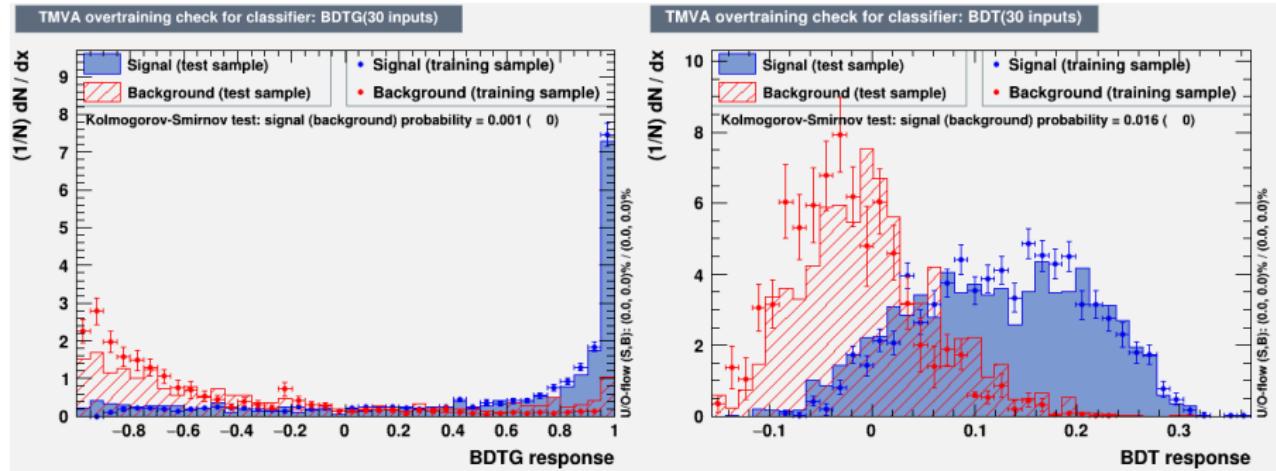
Correlation Matrix (signal)

Correlation Matrix (background)

(30 input variables)

(30 input variables)



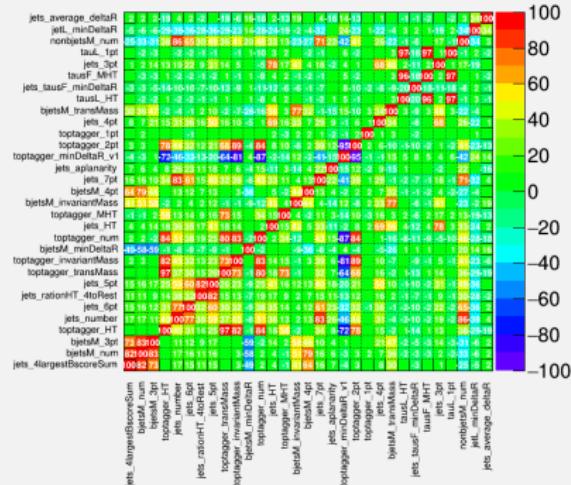


Results of all training

1tau2os

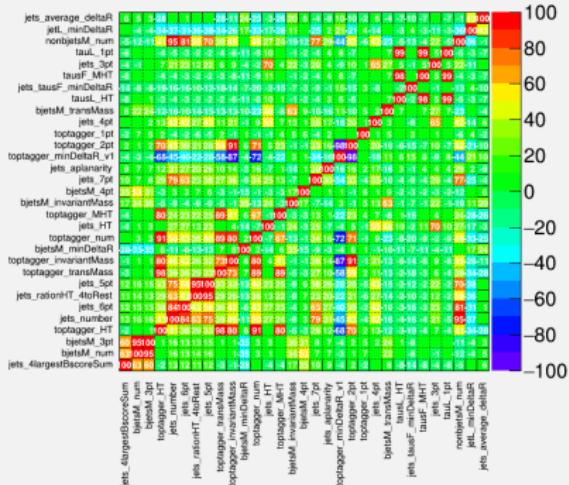
Correlation Matrix (signal)

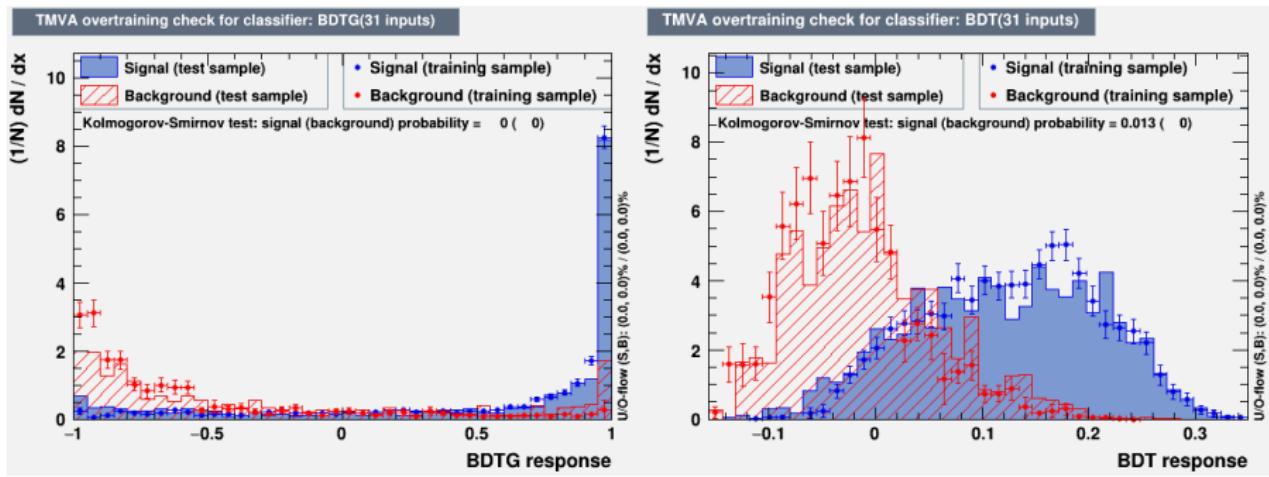
(31 input variables)



Correlation Matrix (background)

(31 input variables)



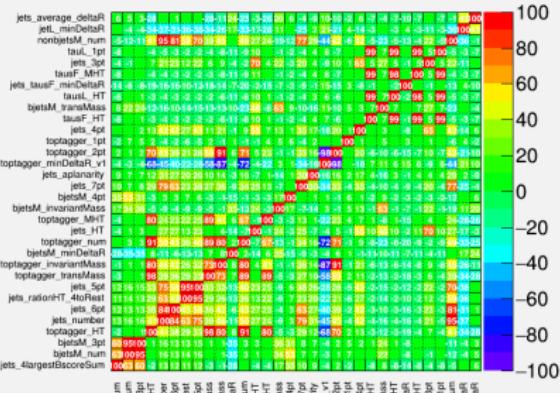
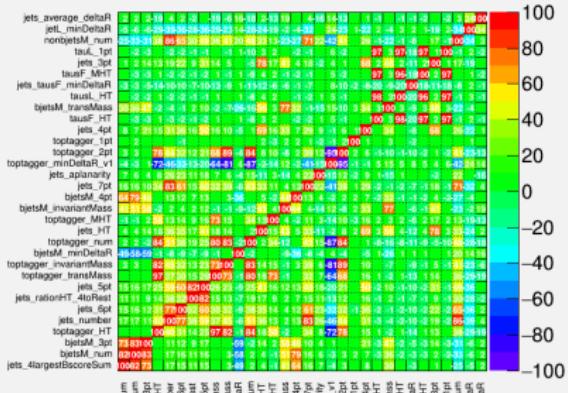


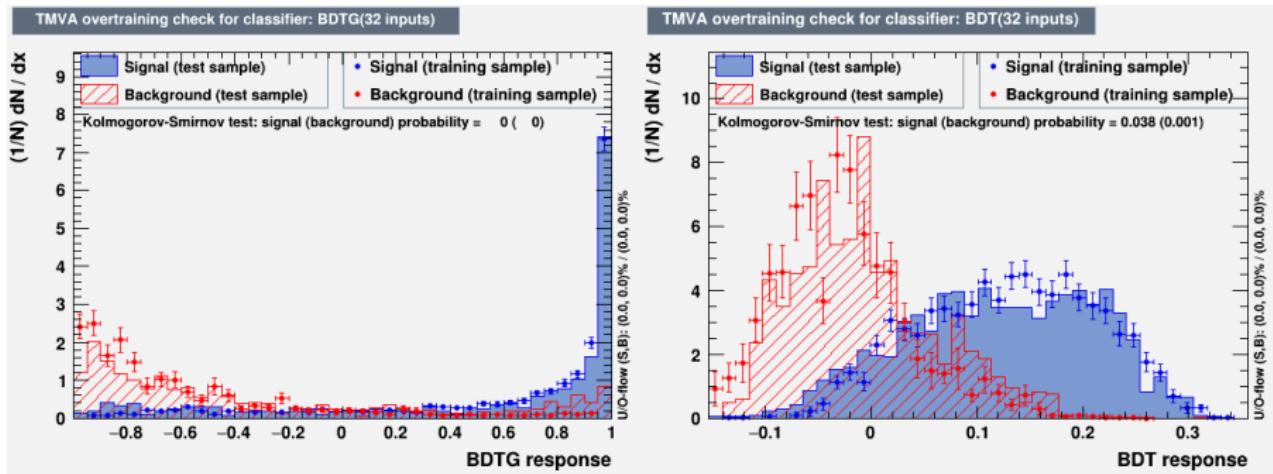
Correlation Matrix (signal)

Correlation Matrix (background)

(32 input variables)

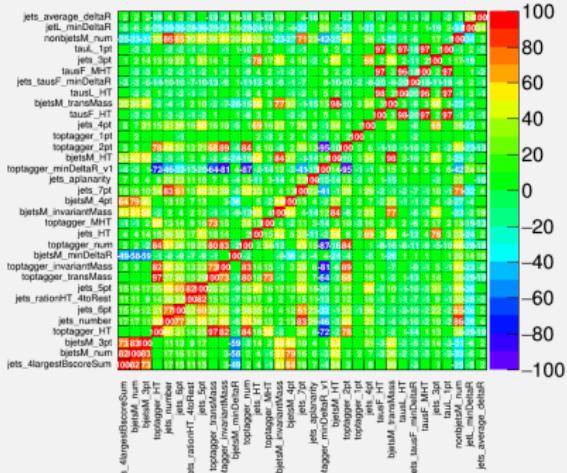
(32 input variables)





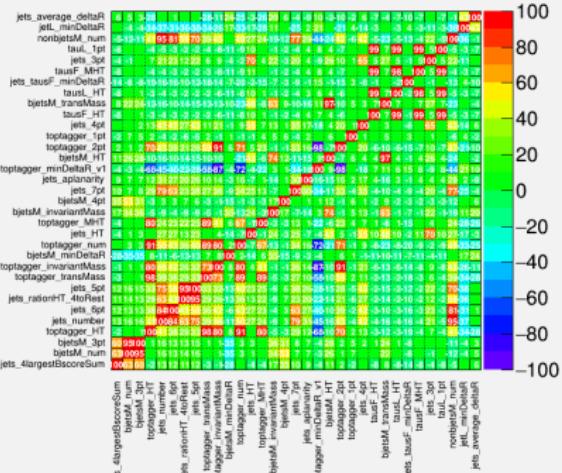
Correlation Matrix (signal)

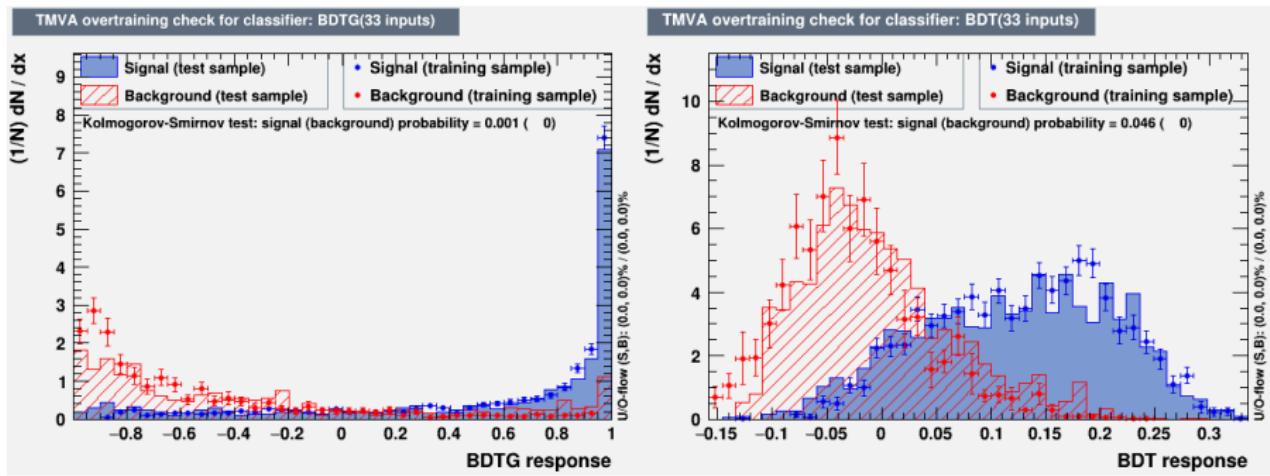
(33 input variables)



Correlation Matrix (background)

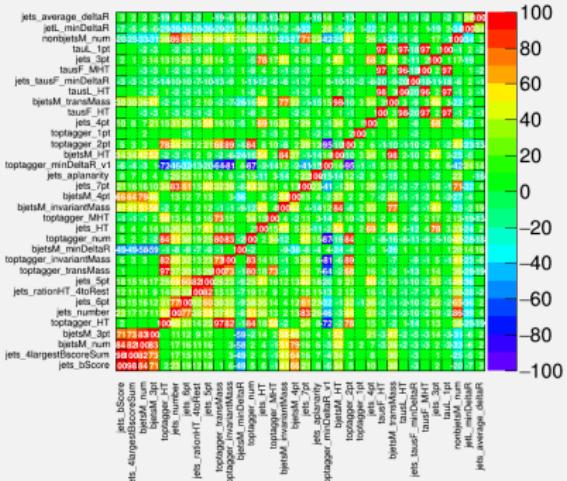
(33 input variables)





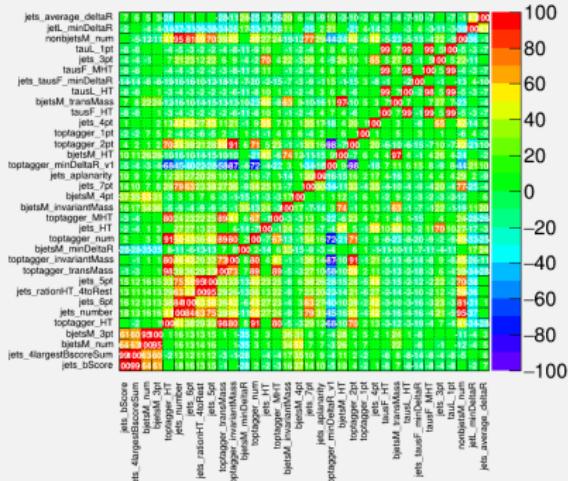
Correlation Matrix (signal)

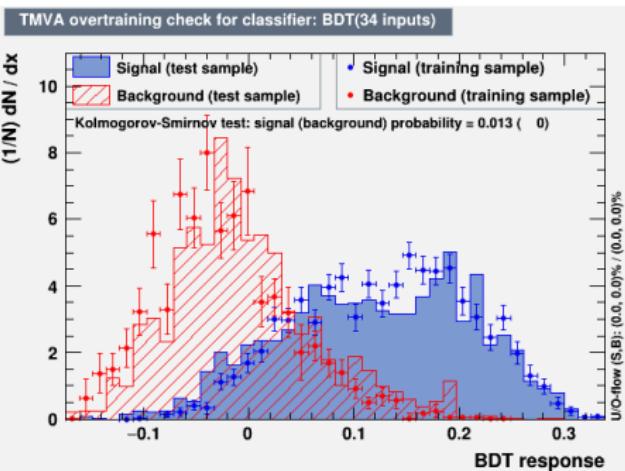
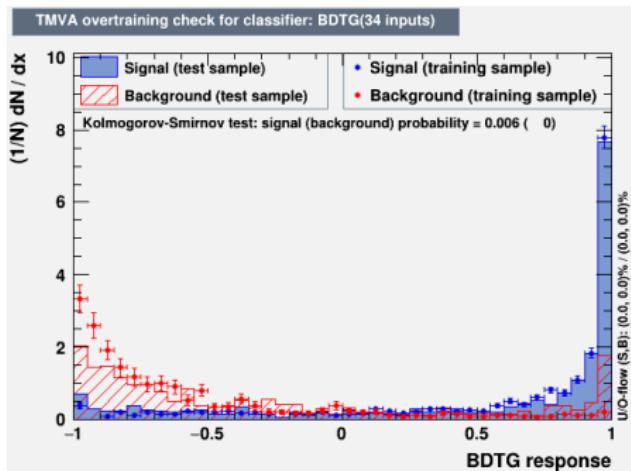
(34 input variables)



Correlation Matrix (background)

(34 input variables)



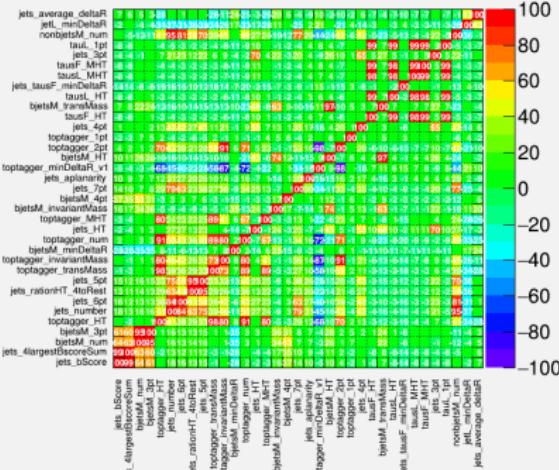
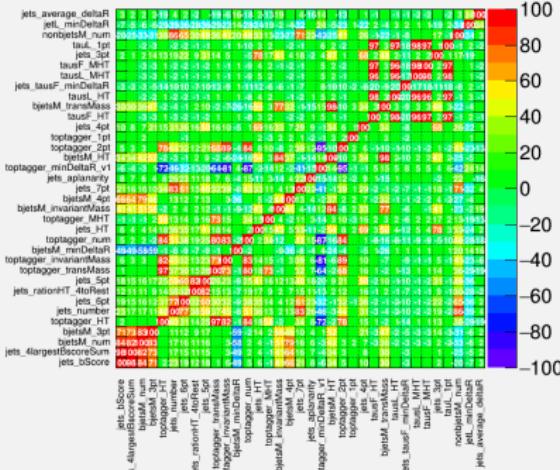


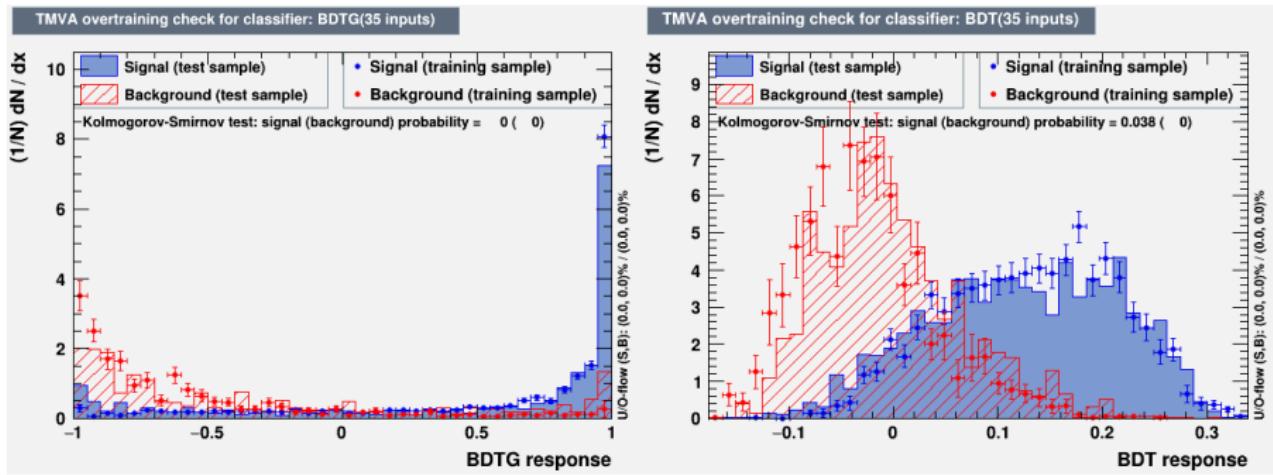
Correlation Matrix (signal)

Correlation Matrix (background)

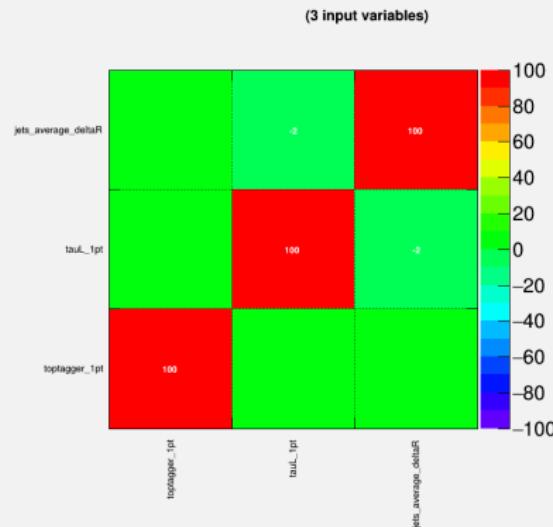
(35 input variables)

(35 input variables)

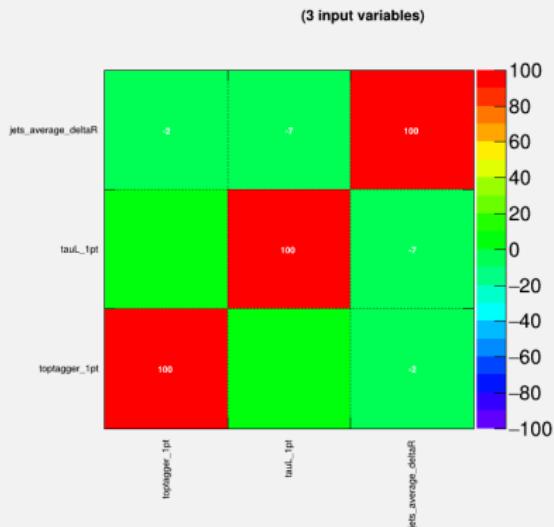


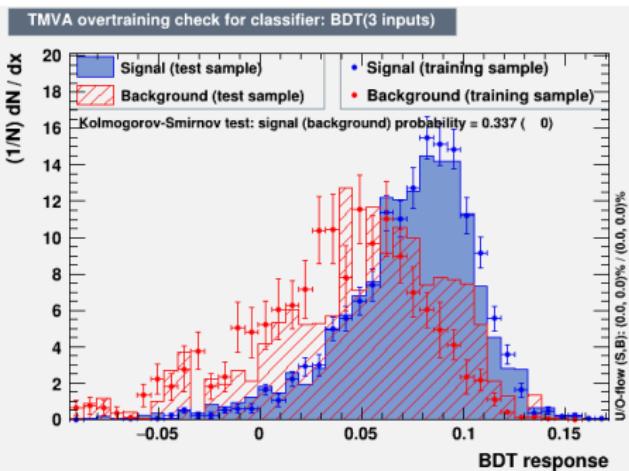
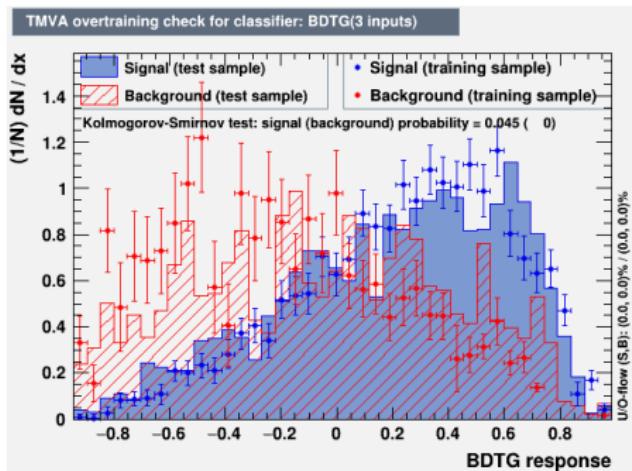


Correlation Matrix (signal)

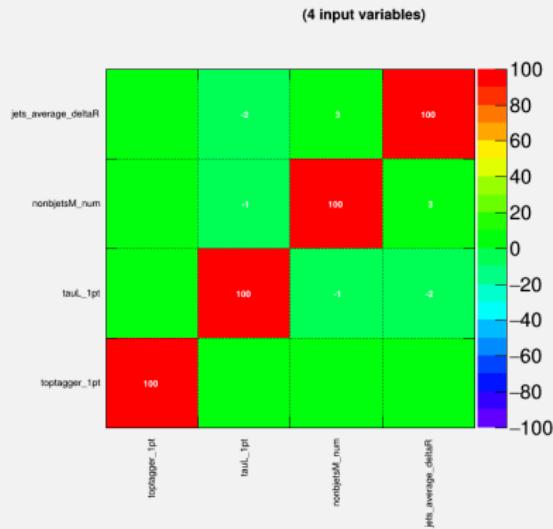


Correlation Matrix (background)

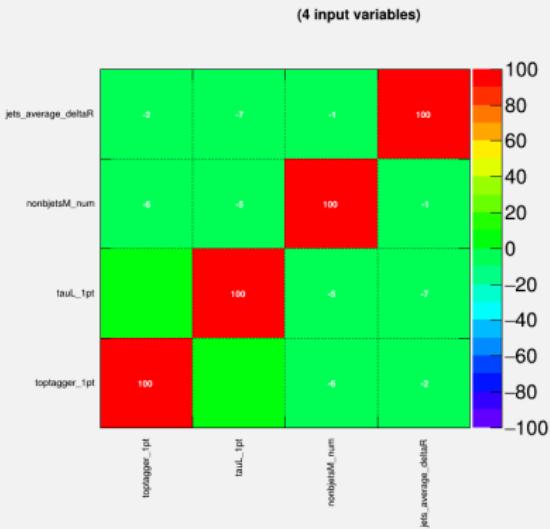


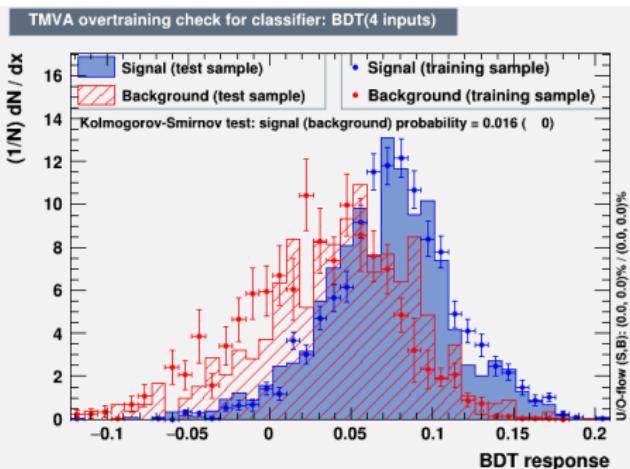
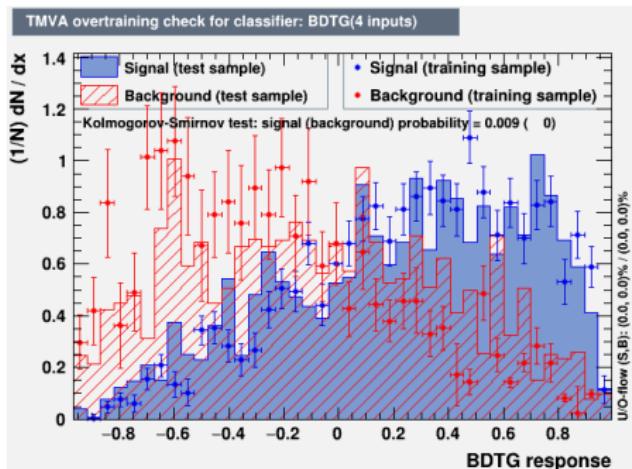


Correlation Matrix (signal)



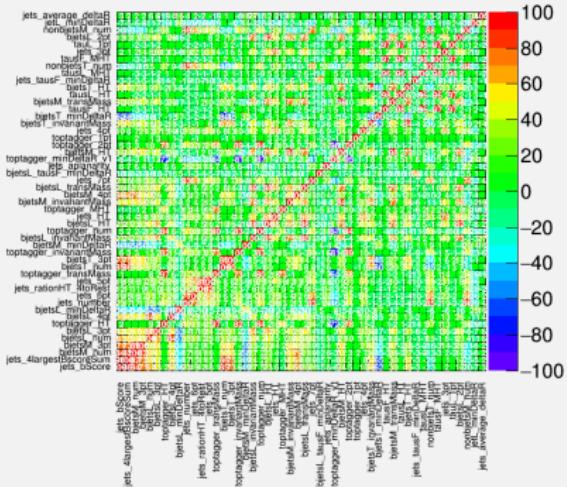
Correlation Matrix (background)





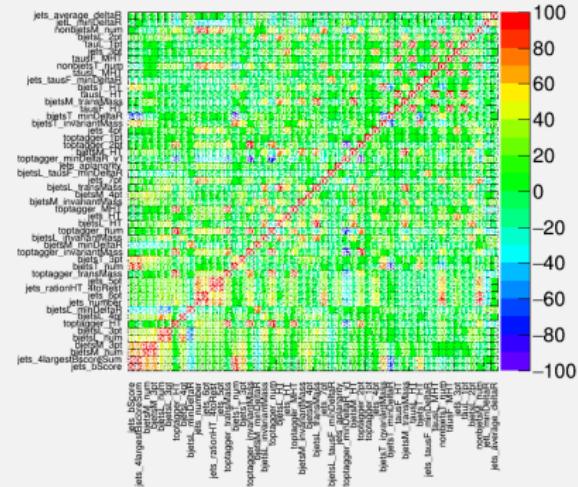
Correlation Matrix (signal)

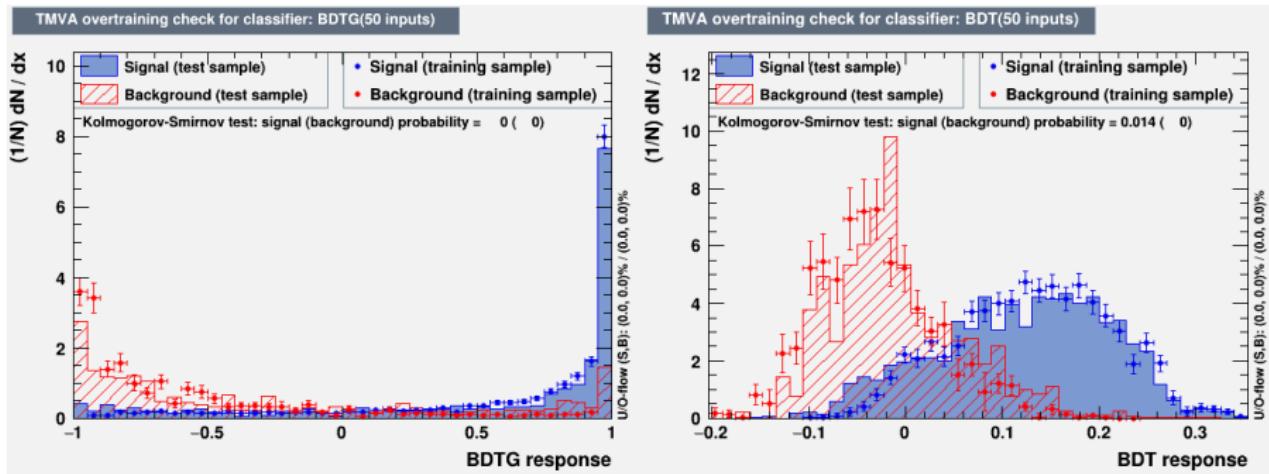
(50 input variables)



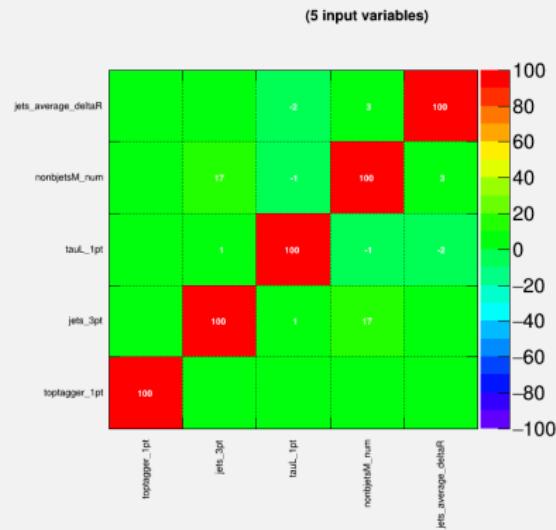
Correlation Matrix (background)

(50 input variables)

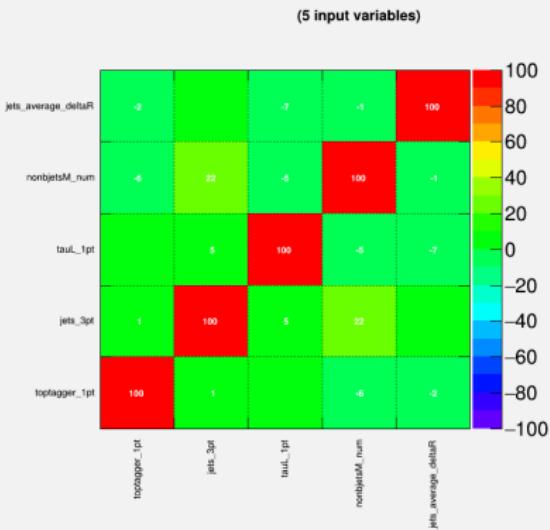


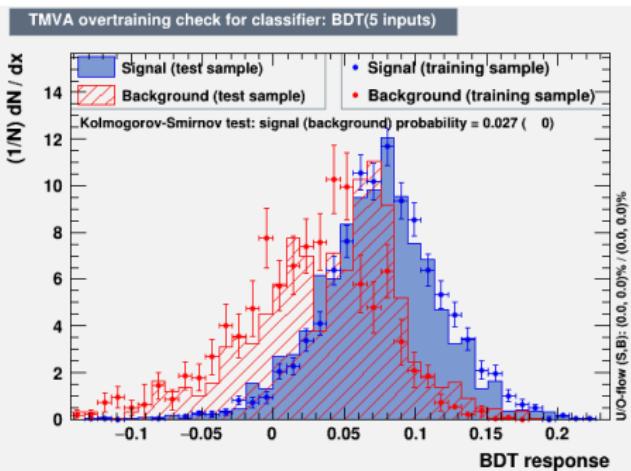
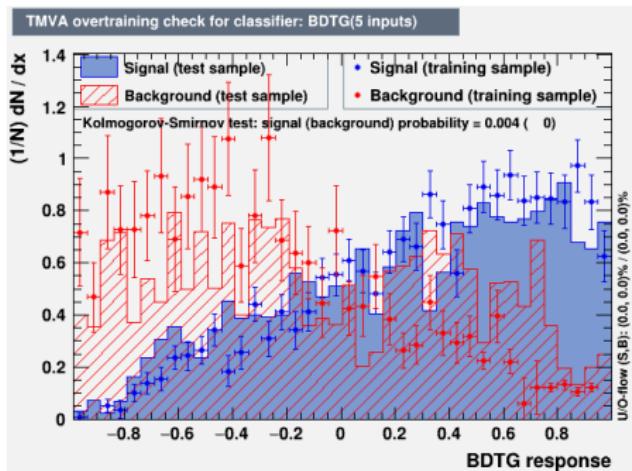


Correlation Matrix (signal)

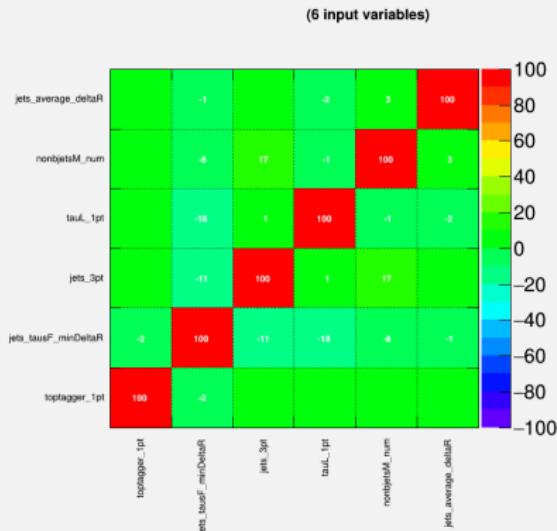


Correlation Matrix (background)

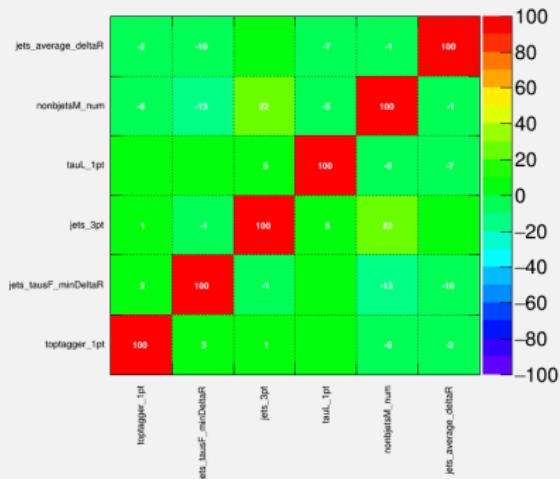


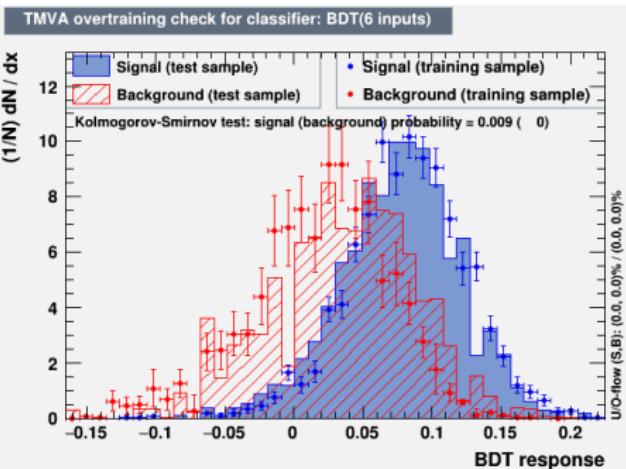
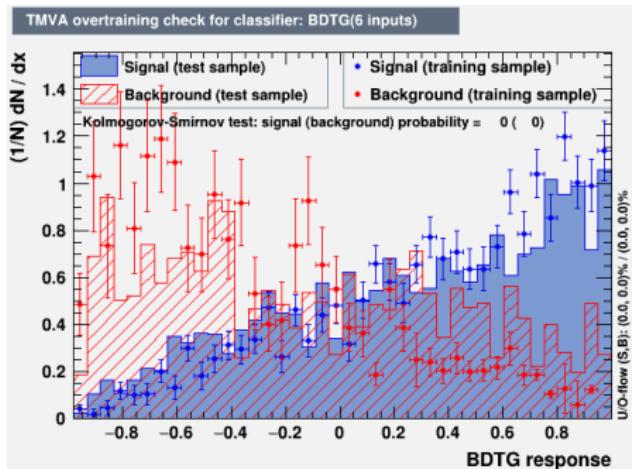


Correlation Matrix (signal)



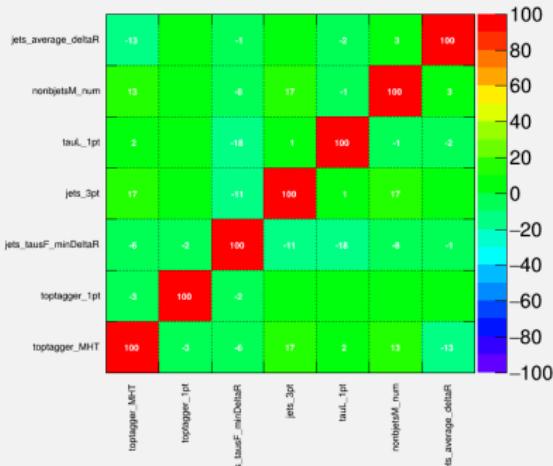
Correlation Matrix (background)





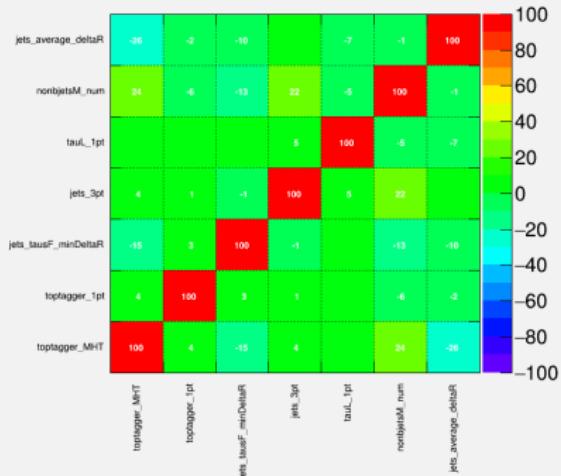
Correlation Matrix (signal)

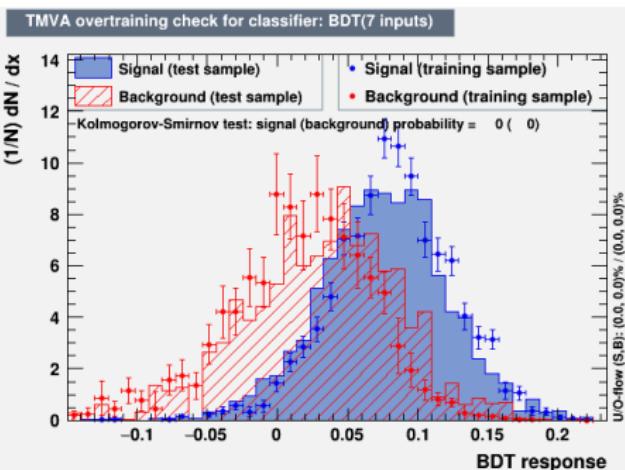
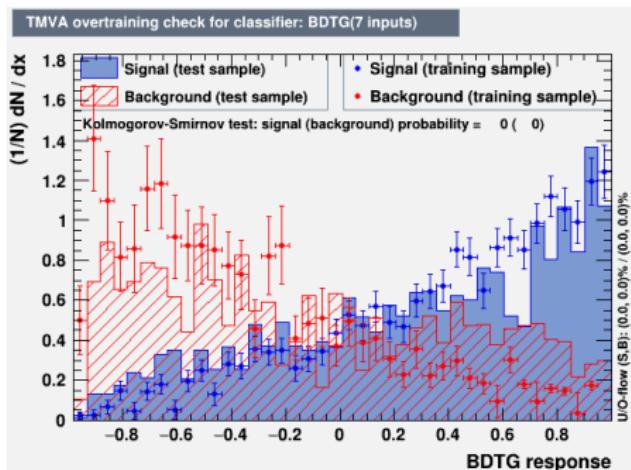
(7 input variables)



Correlation Matrix (background)

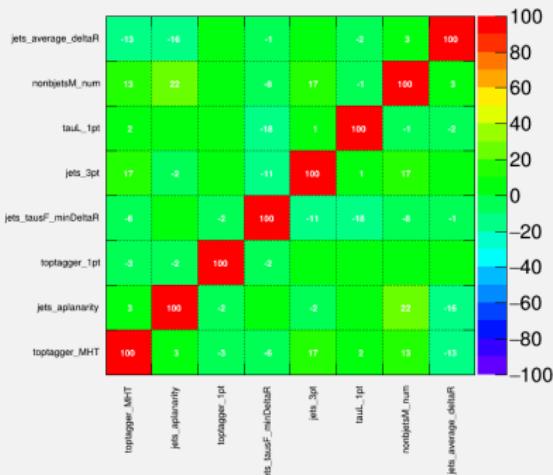
(7 input variables)





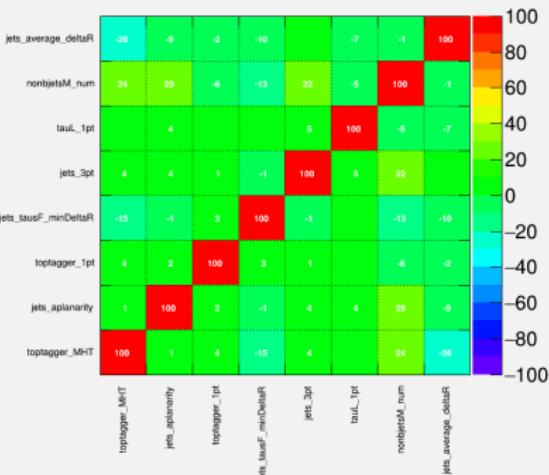
Correlation Matrix (signal)

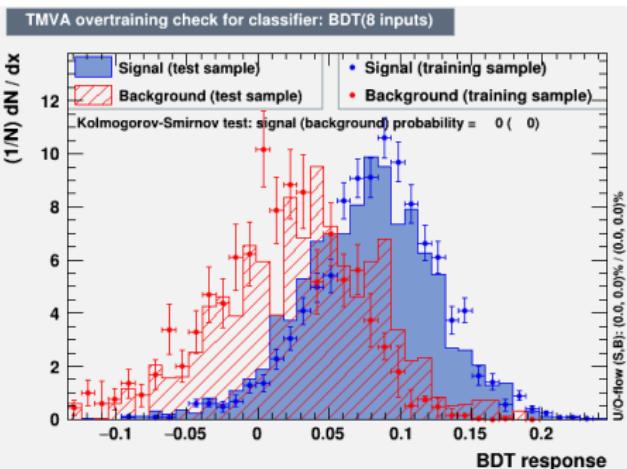
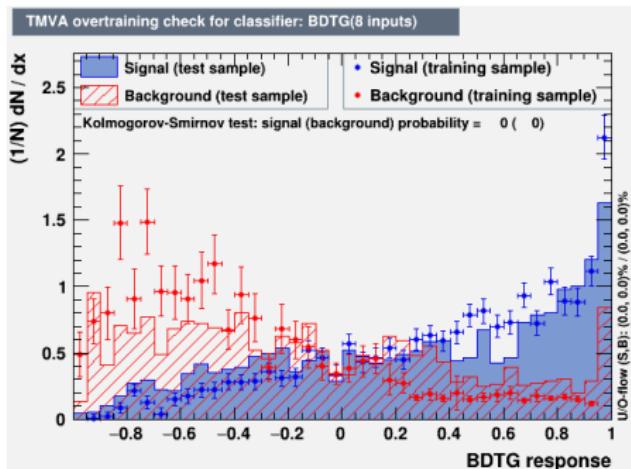
(8 input variables)



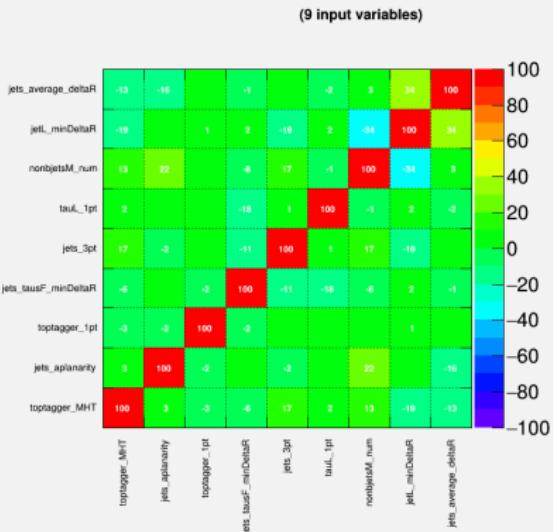
Correlation Matrix (background)

(8 input variables)

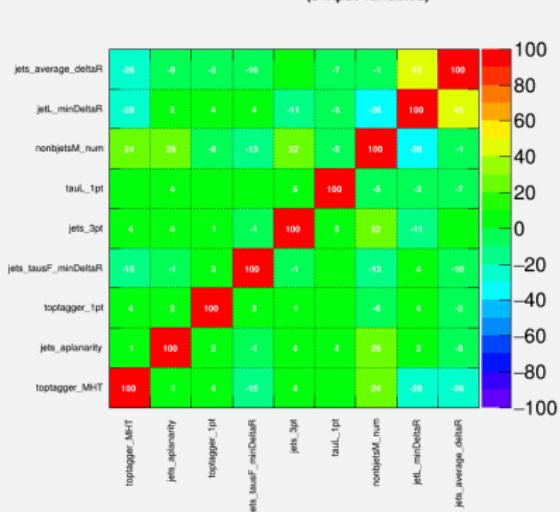


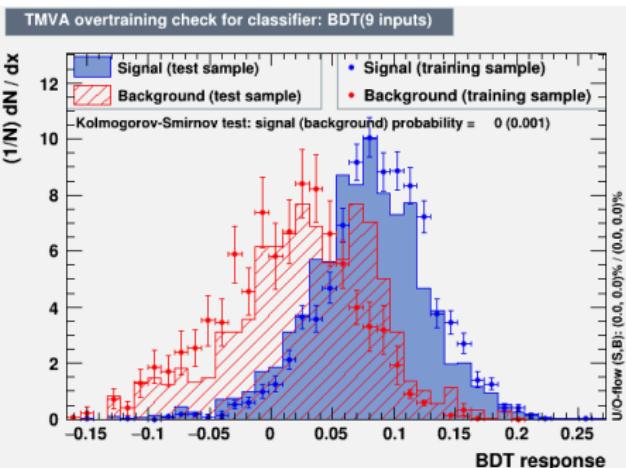
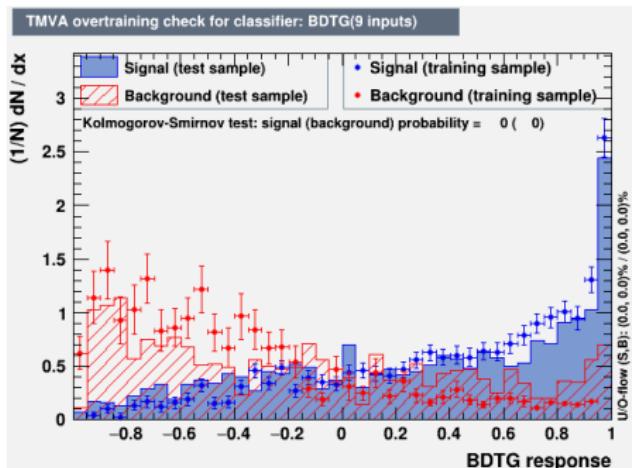


Correlation Matrix (signal)



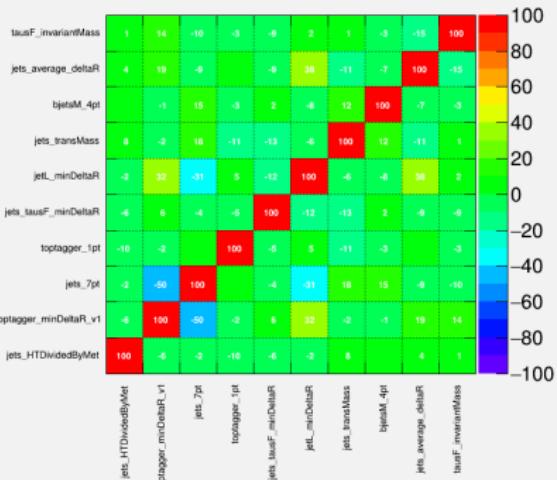
Correlation Matrix (background)





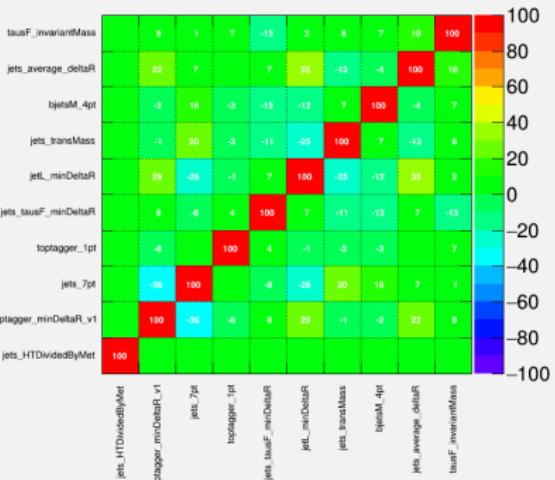
Correlation Matrix (background)

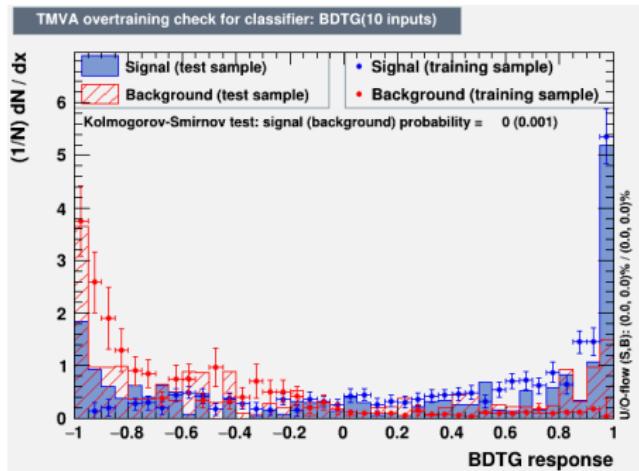
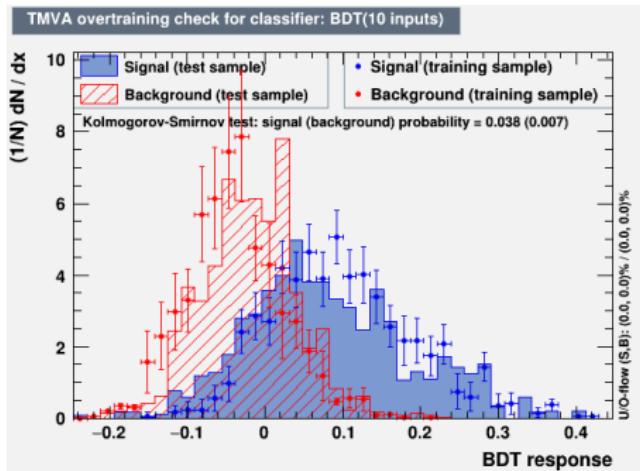
(10 input variables)



Correlation Matrix (signal)

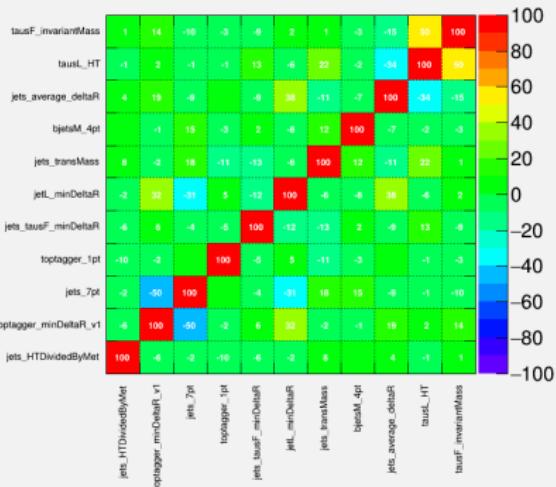
(10 input variables)





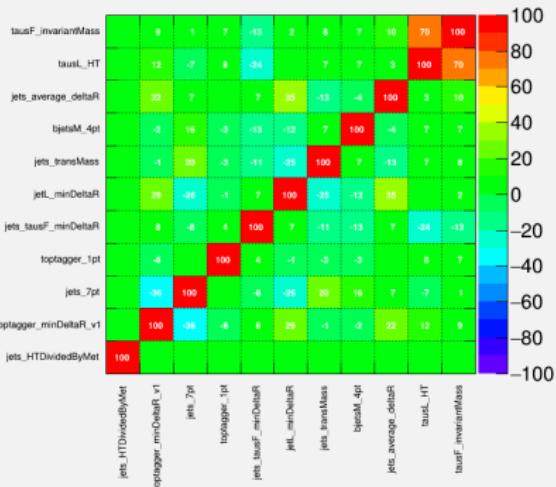
Correlation Matrix (background)

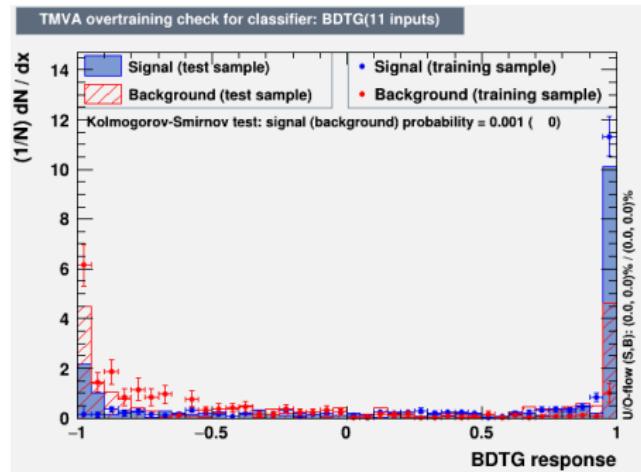
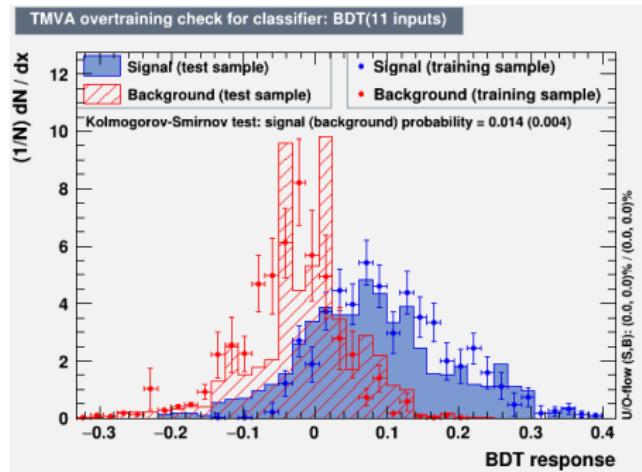
(11 input variables)



Correlation Matrix (signal)

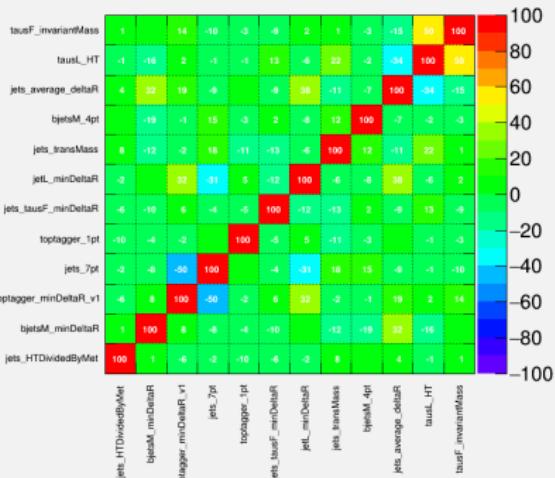
(11 input variables)





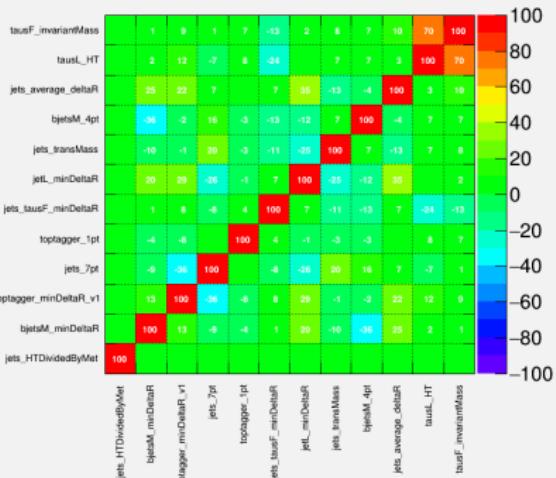
Correlation Matrix (background)

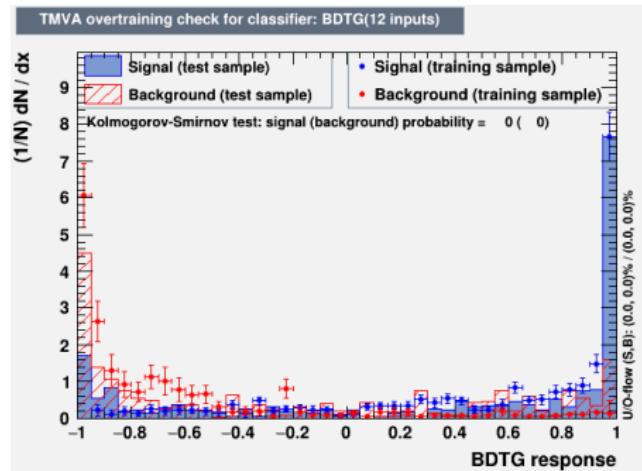
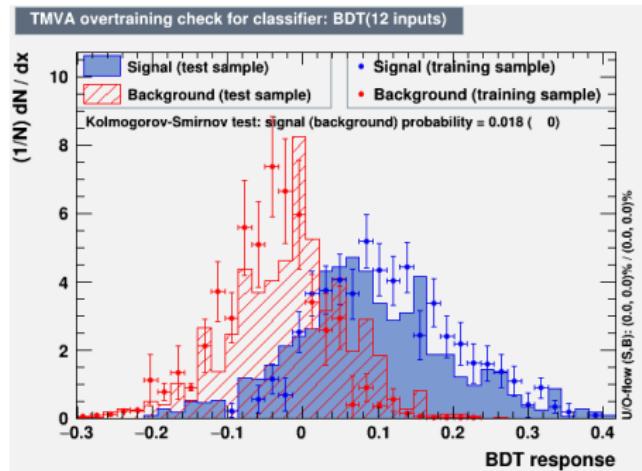
(12 input variables)



Correlation Matrix (signal)

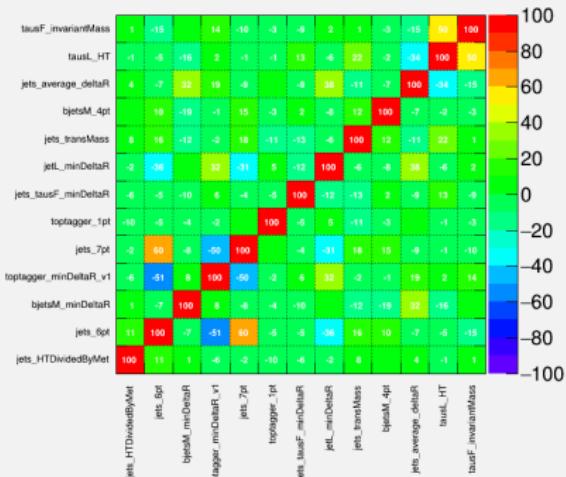
(12 input variables)





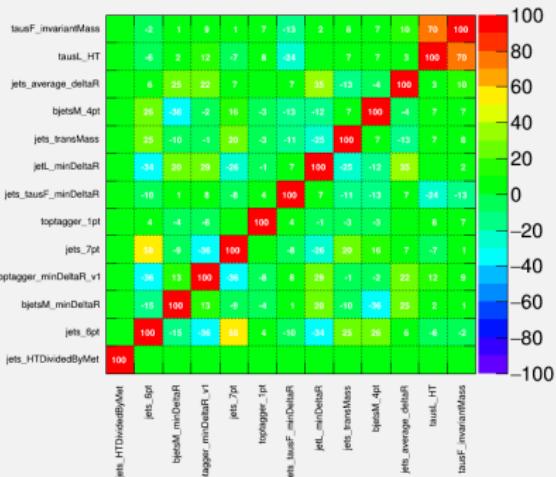
Correlation Matrix (background)

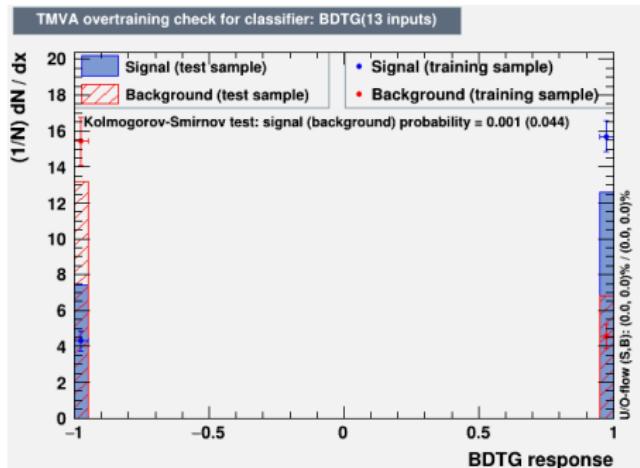
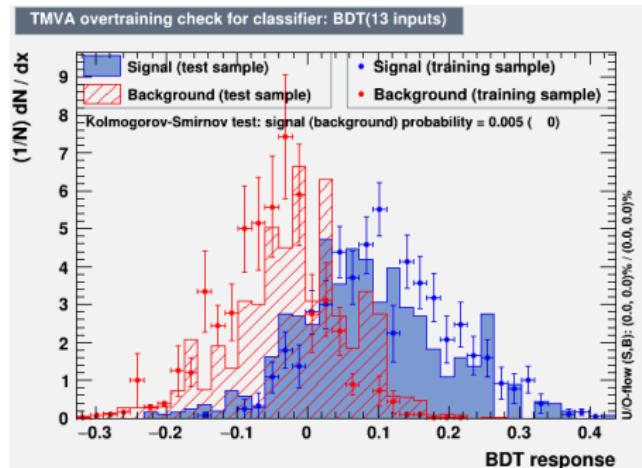
(13 input variables)



Correlation Matrix (signal)

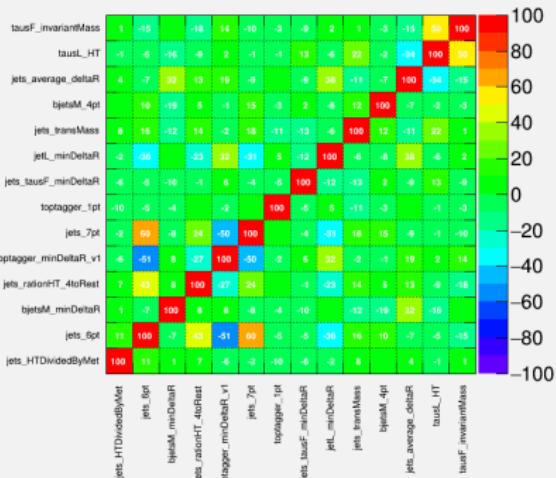
(13 input variables)





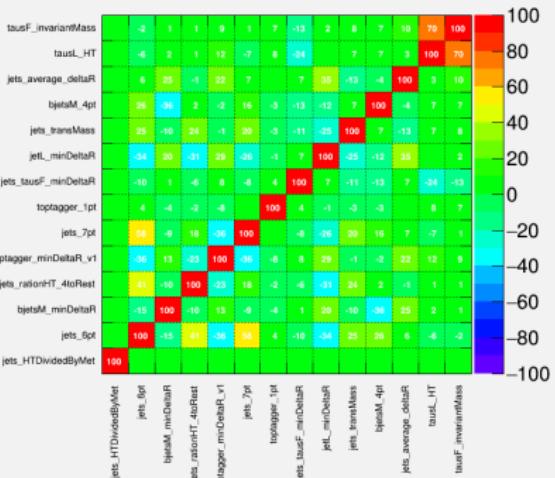
Correlation Matrix (background)

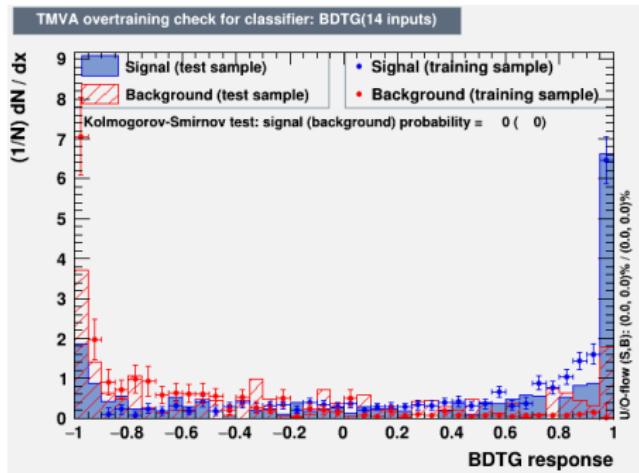
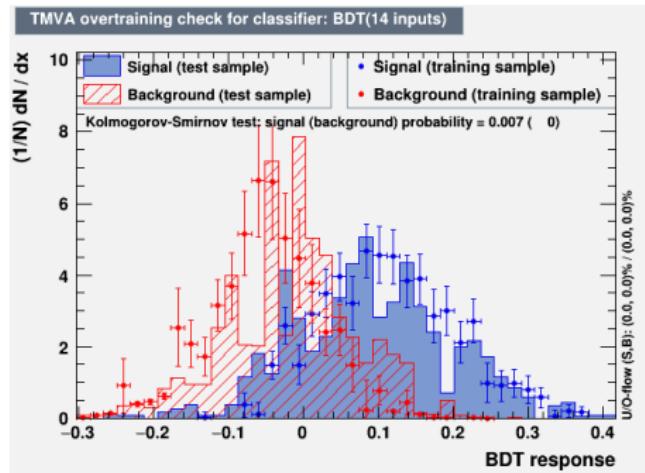
(14 input variables)



Correlation Matrix (signal)

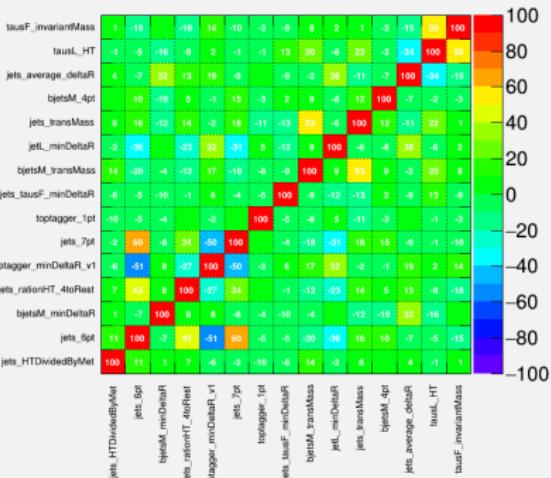
(14 input variables)





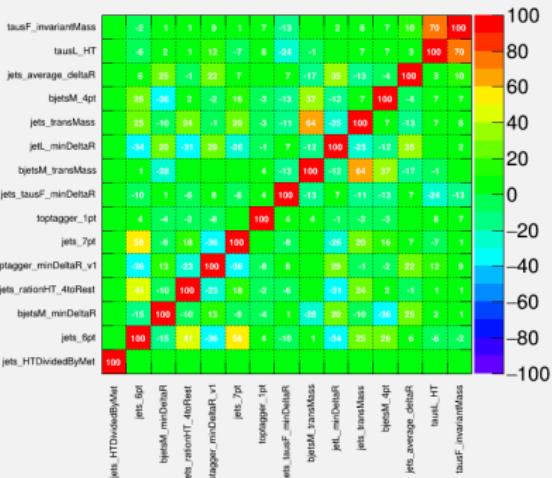
Correlation Matrix (background)

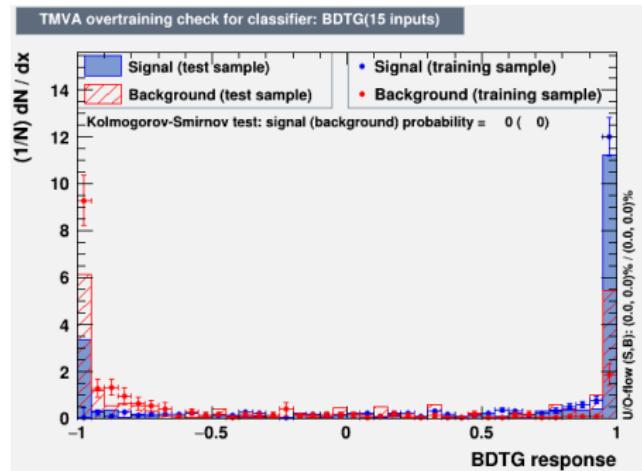
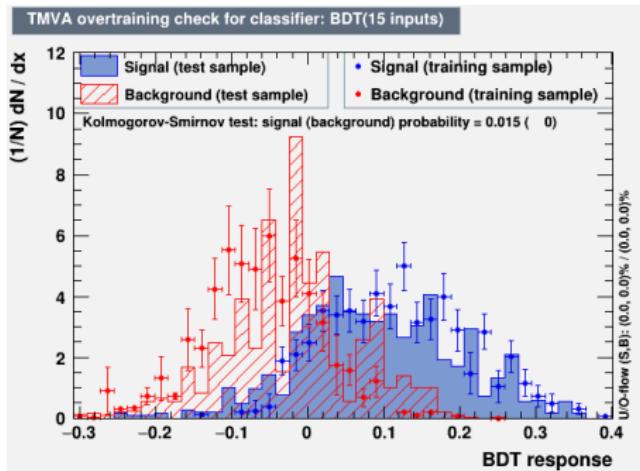
(15 input variables)



Correlation Matrix (signal)

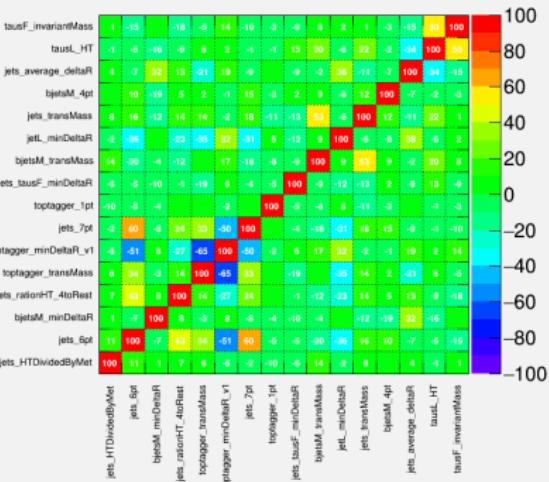
(15 input variables)





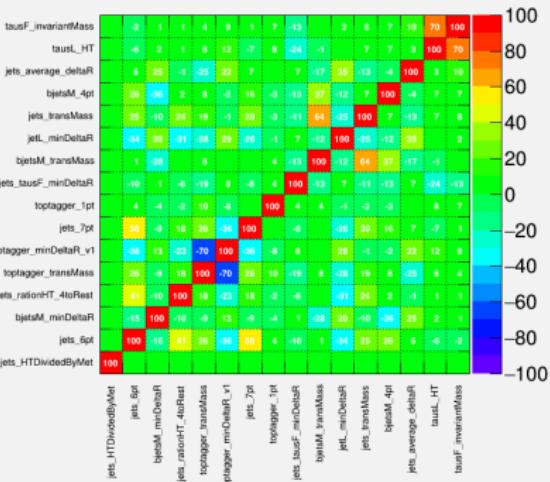
Correlation Matrix (background)

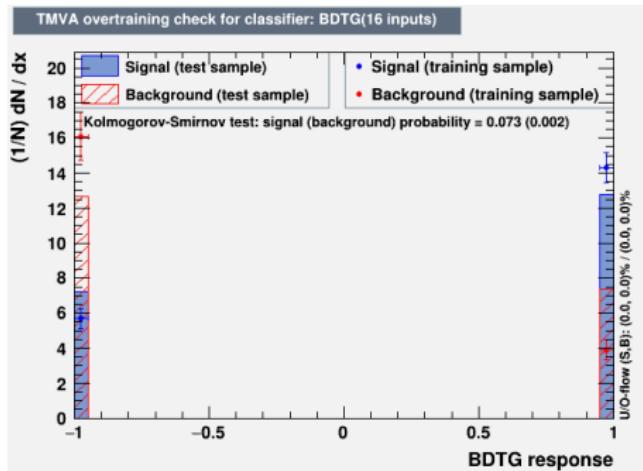
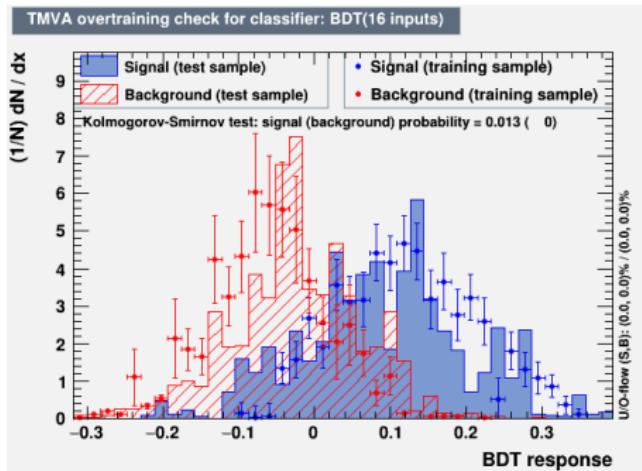
(16 input variables)



Correlation Matrix (signal)

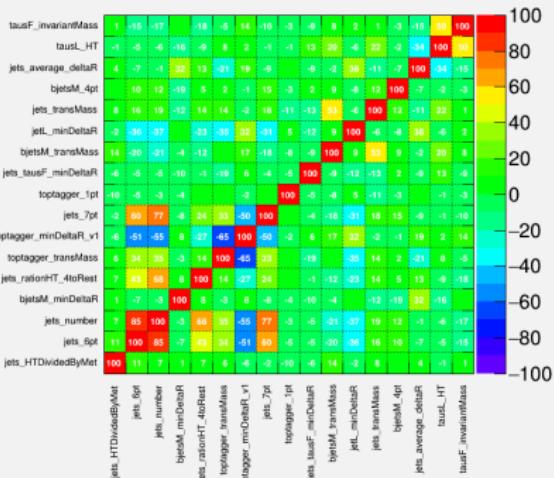
(16 input variables)





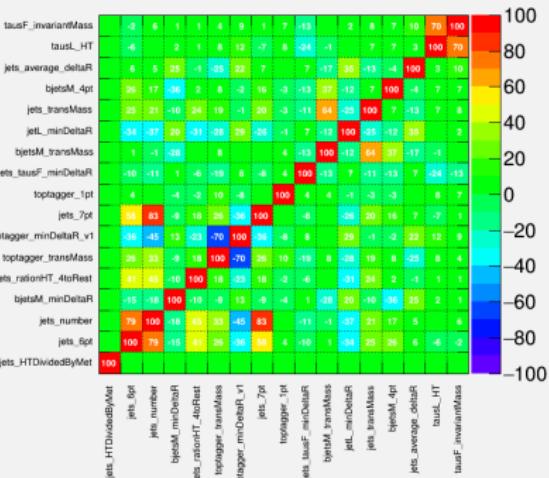
Correlation Matrix (background)

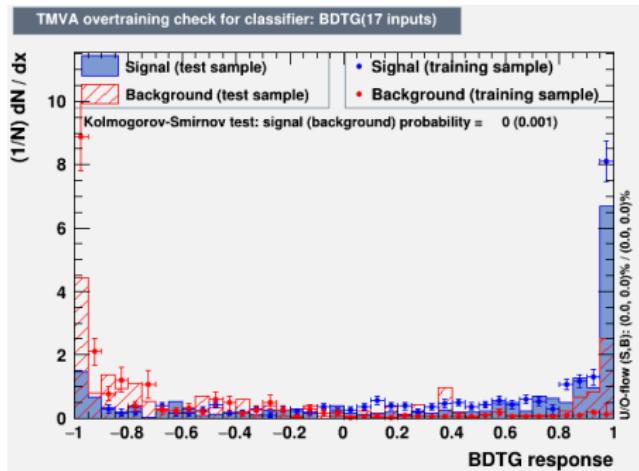
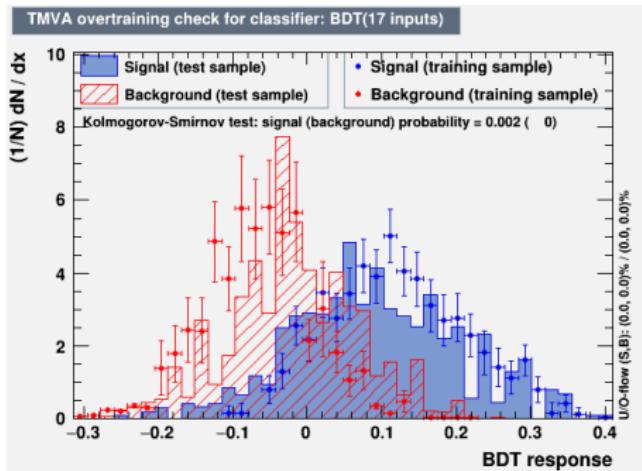
(17 input variables)



Correlation Matrix (signal)

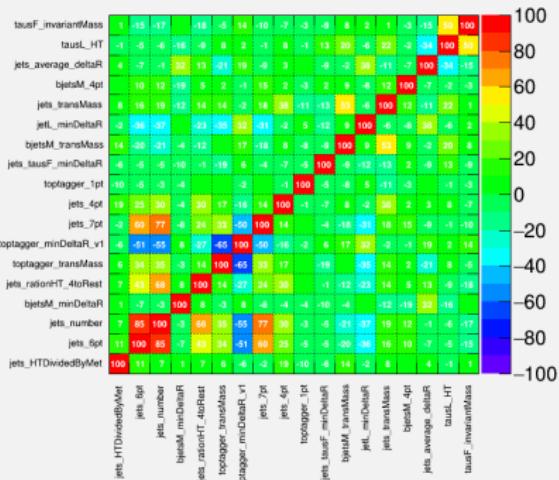
(17 input variables)





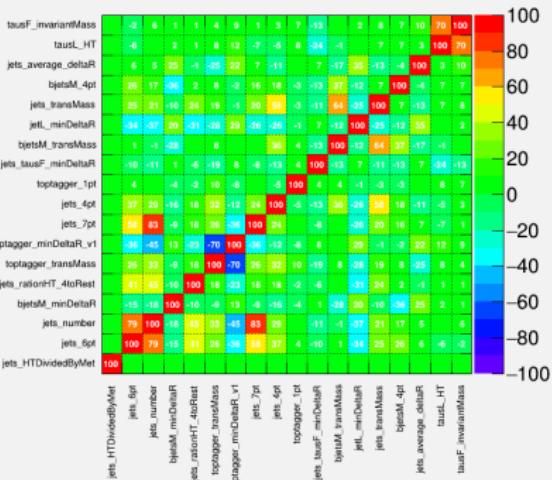
Correlation Matrix (background)

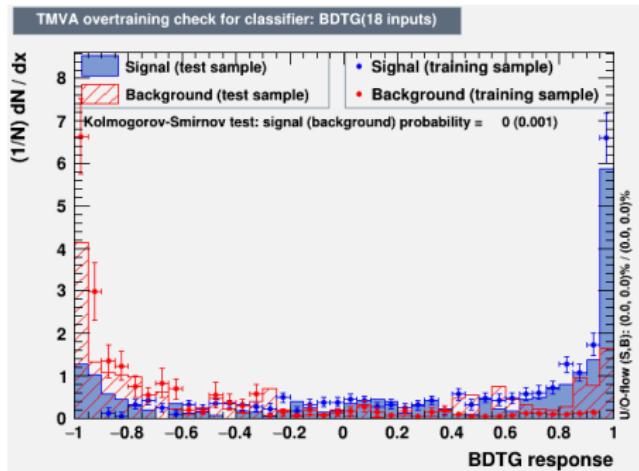
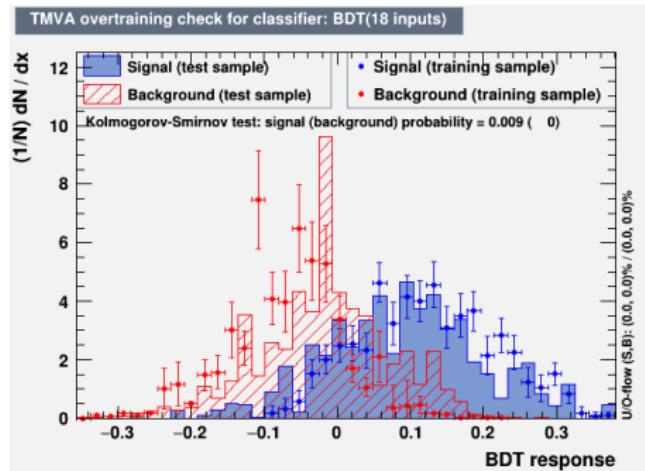
(18 input variables)



Correlation Matrix (signal)

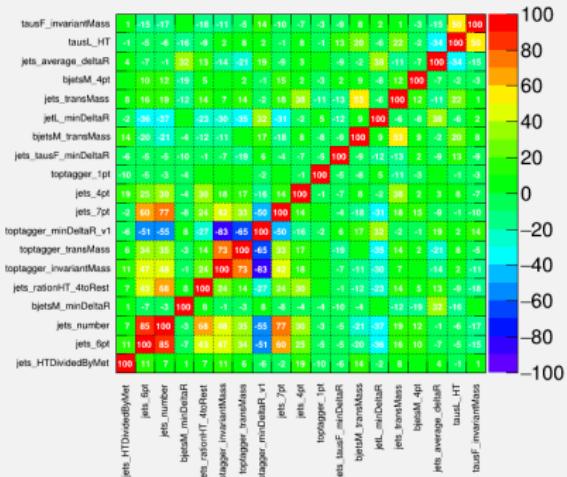
(18 input variables)





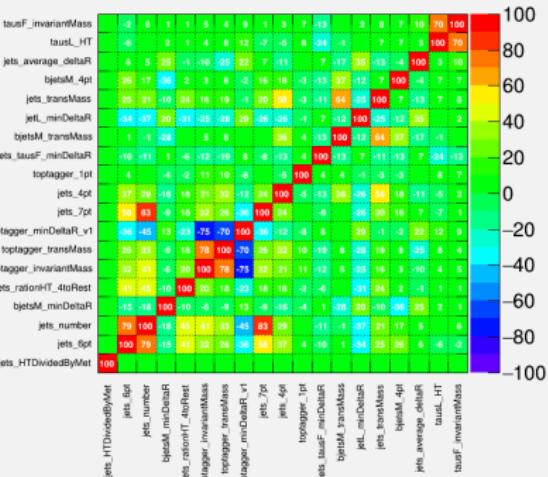
Correlation Matrix (background)

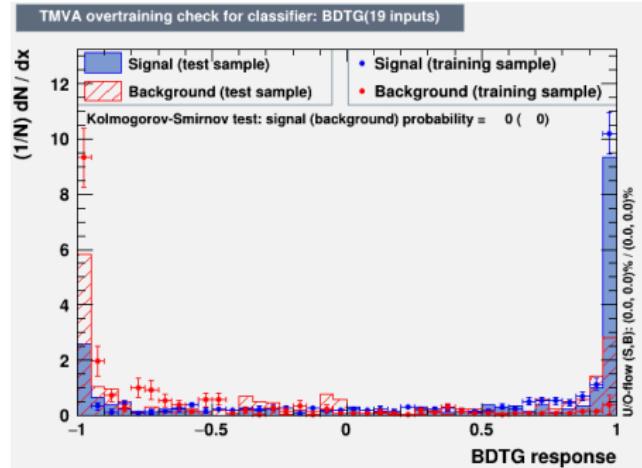
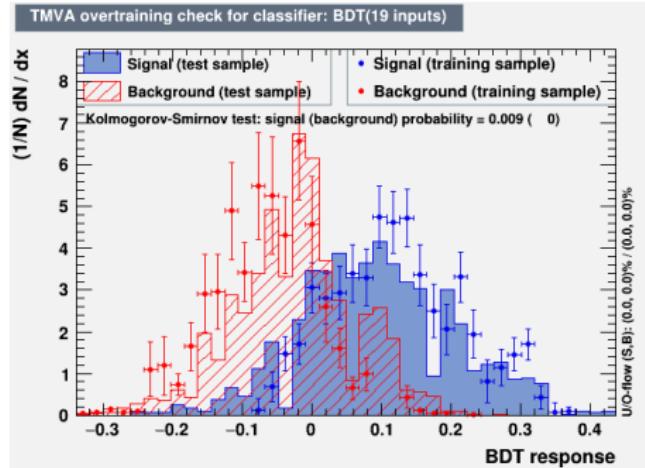
(19 input variables)



Correlation Matrix (signal)

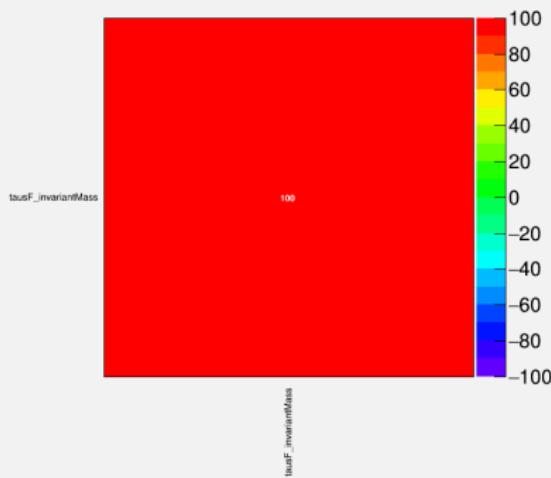
(19 input variables)



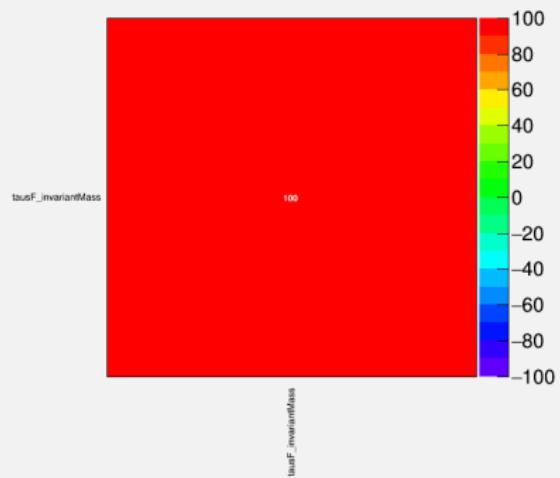


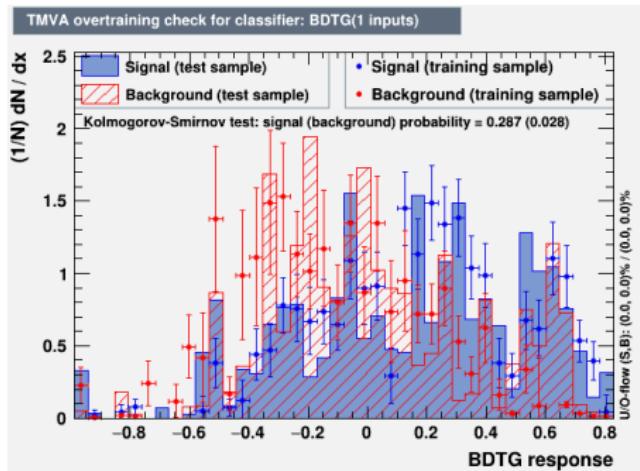
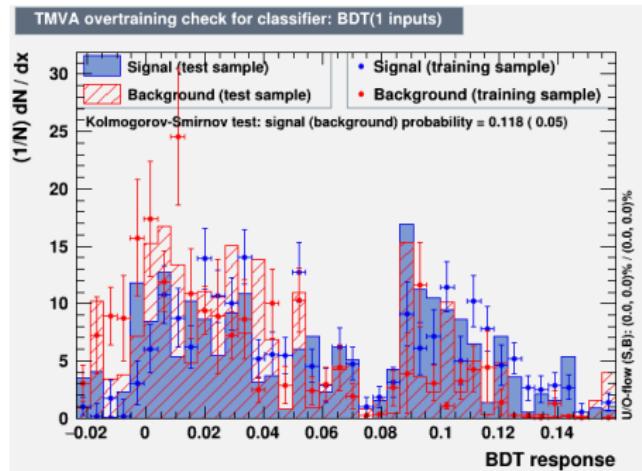
Correlation Matrix (background)

(1 input variables)

**Correlation Matrix (signal)**

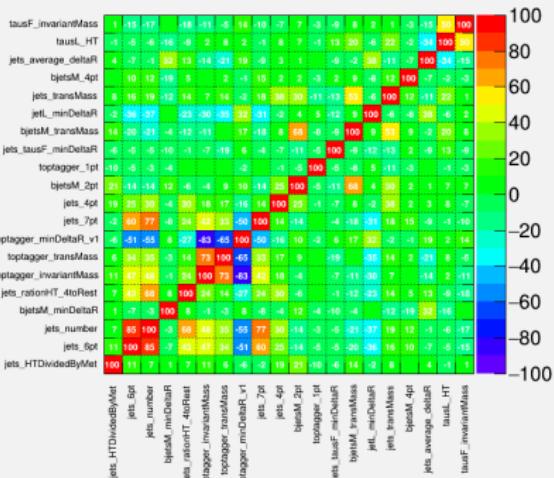
(1 input variables)





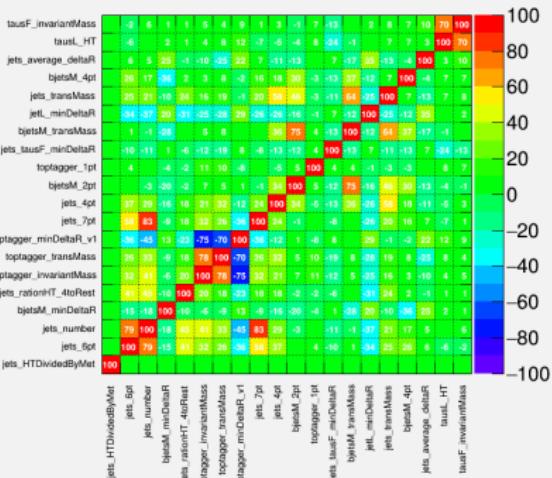
Correlation Matrix (background)

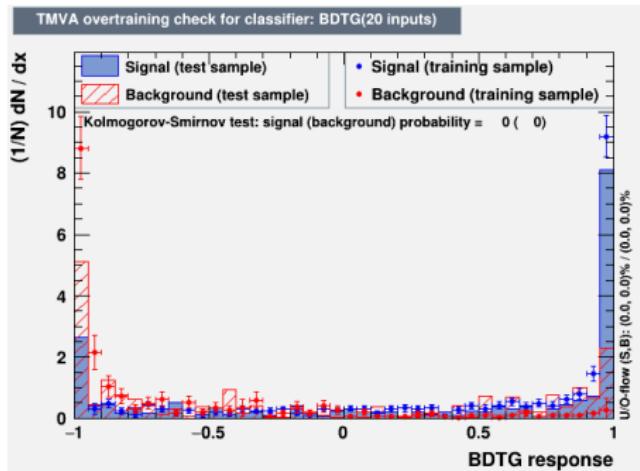
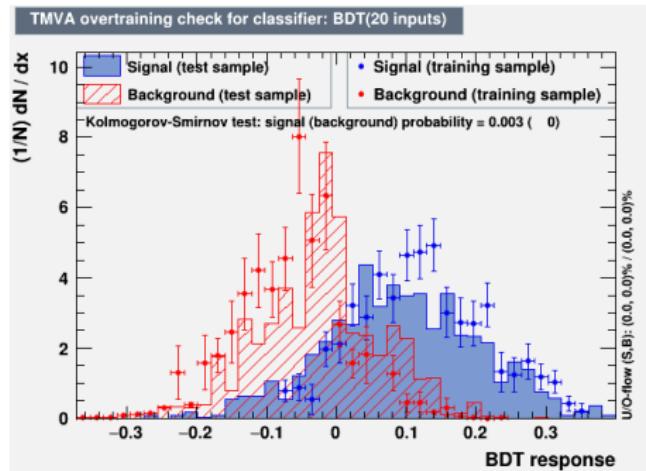
(20 input variables)



Correlation Matrix (signal)

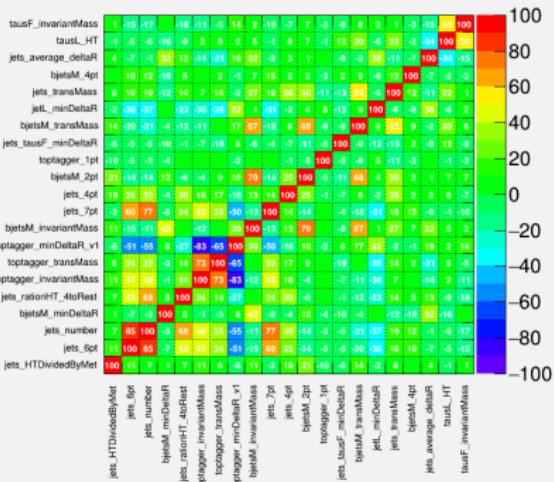
(20 input variables)





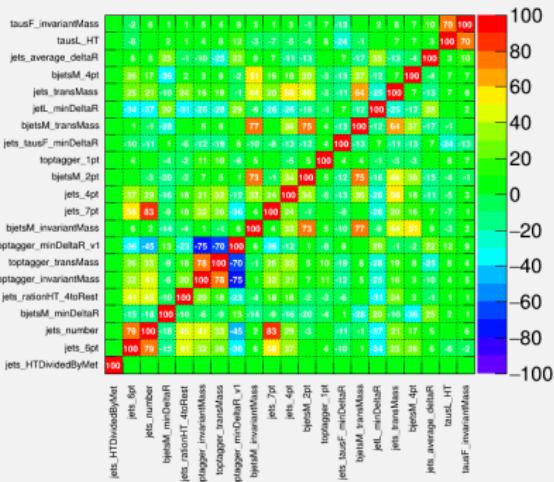
Correlation Matrix (background)

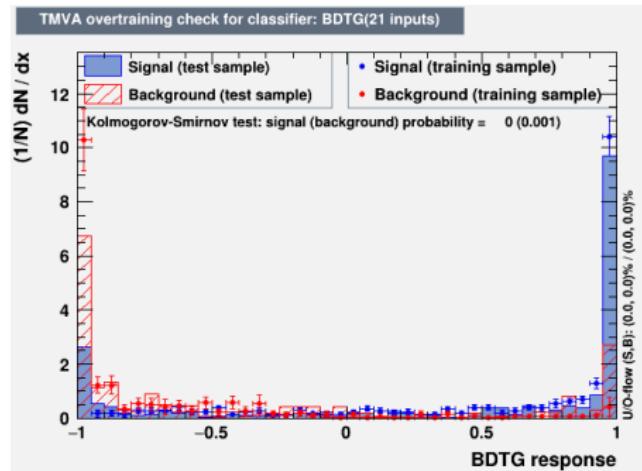
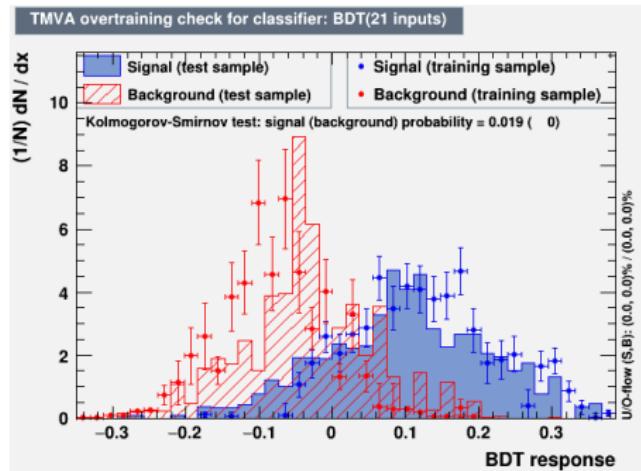
(21 input variables)



Correlation Matrix (signal)

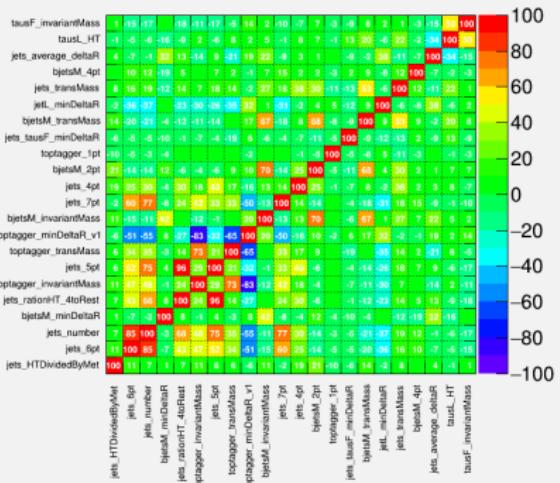
(21 input variables)





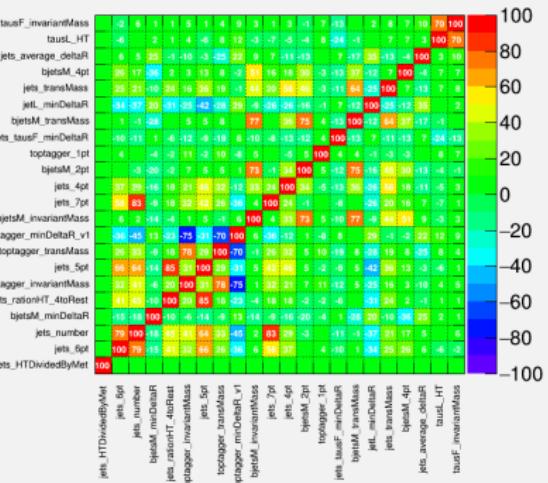
Correlation Matrix (background)

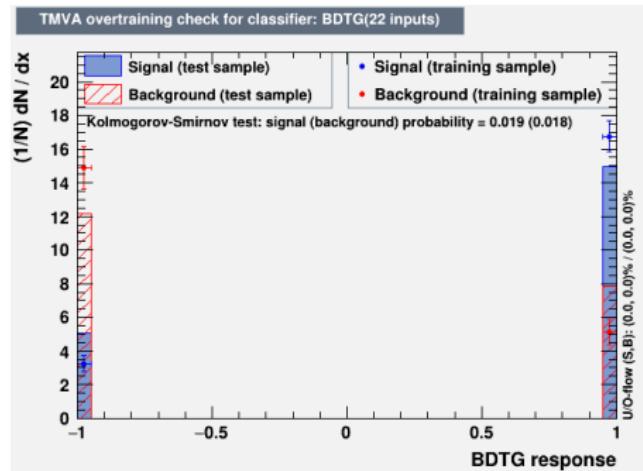
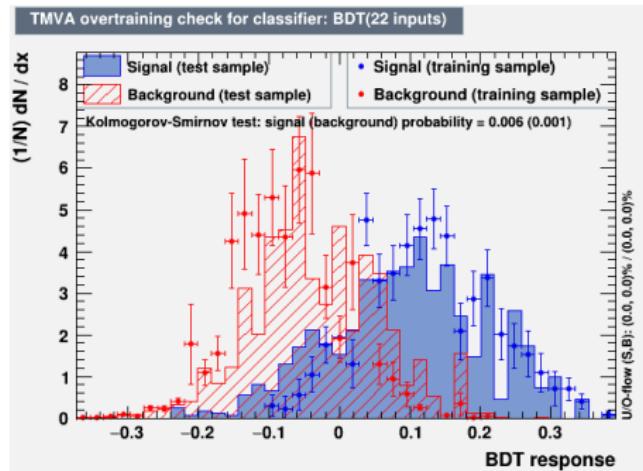
(22 input variables)



Correlation Matrix (signal)

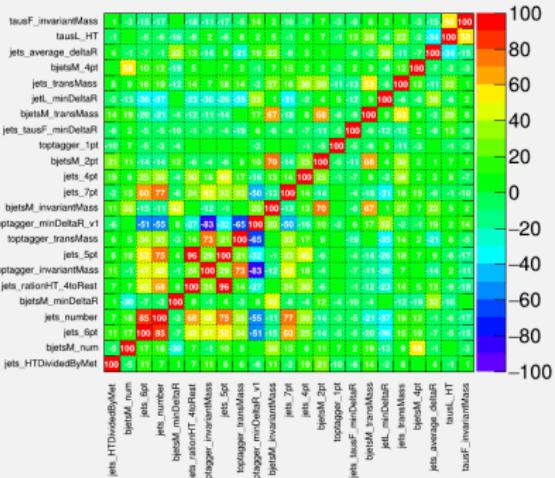
(22 input variables)





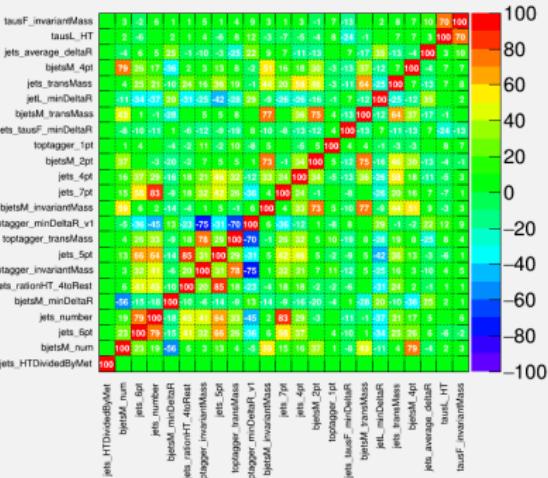
Correlation Matrix (background)

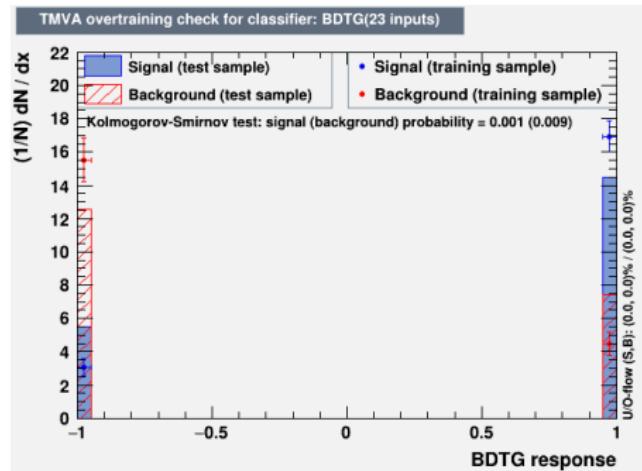
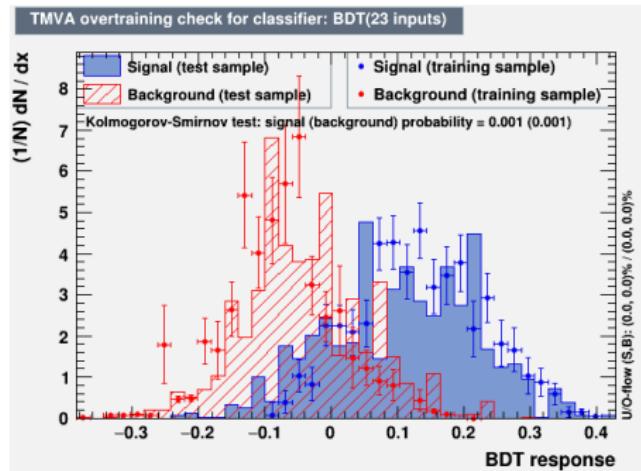
(23 input variables)



Correlation Matrix (signal)

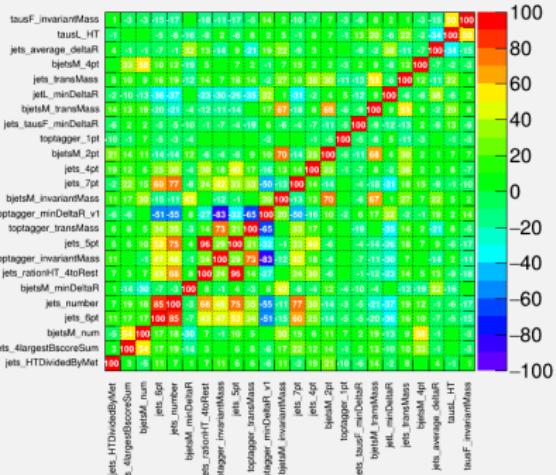
(23 input variables)





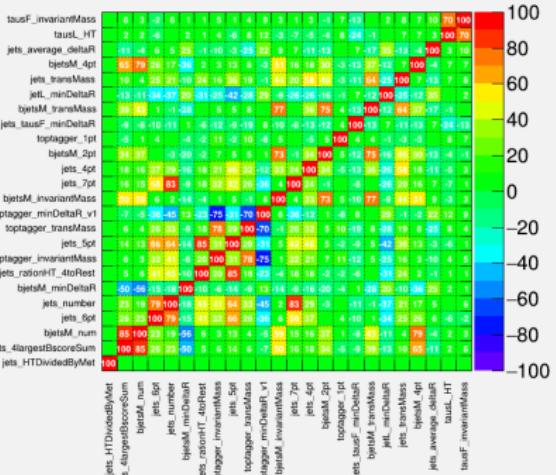
Correlation Matrix (background)

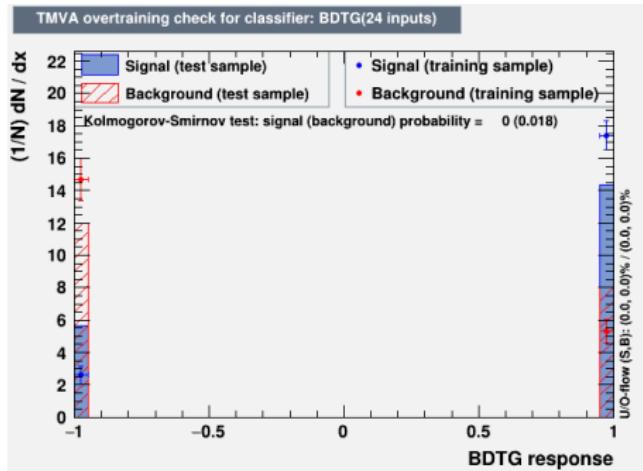
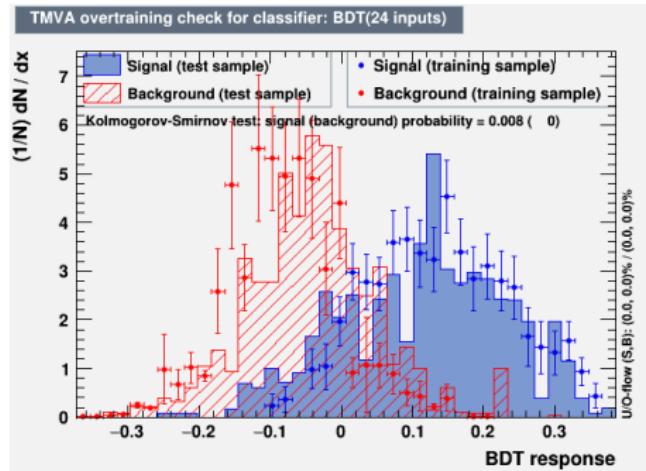
(24 input variables)



Correlation Matrix (signal)

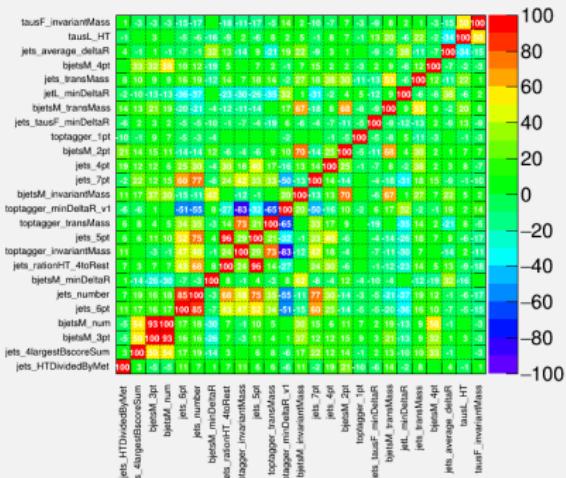
(24 input variables)





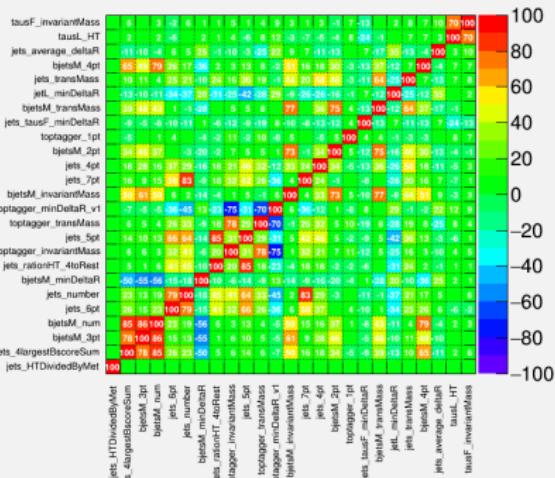
Correlation Matrix (background)

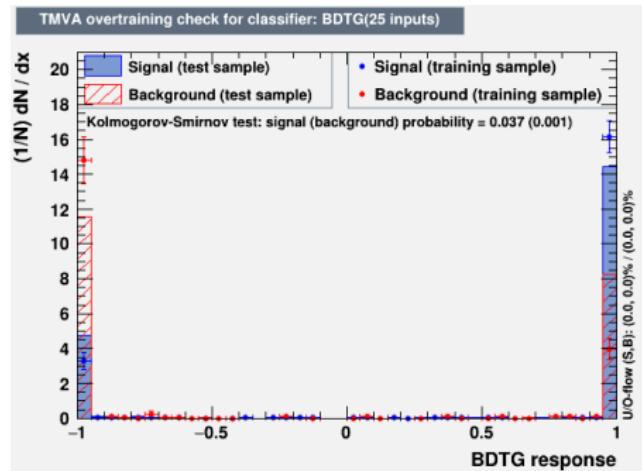
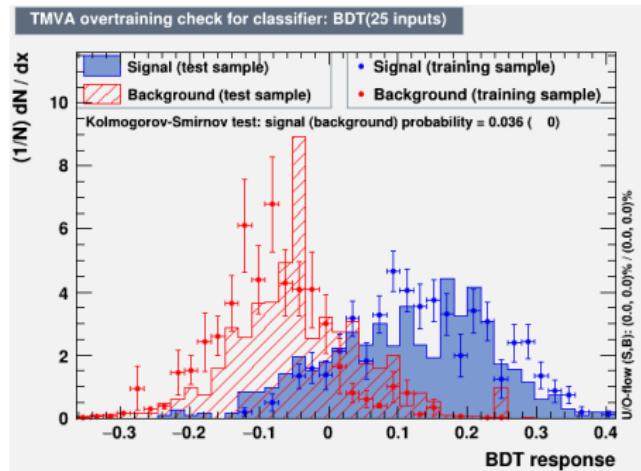
(25 input variables)



Correlation Matrix (signal)

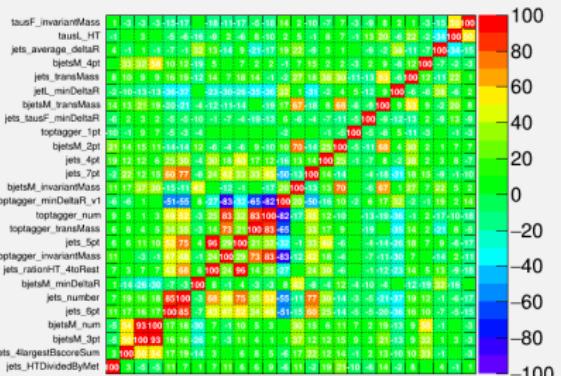
(25 input variables)





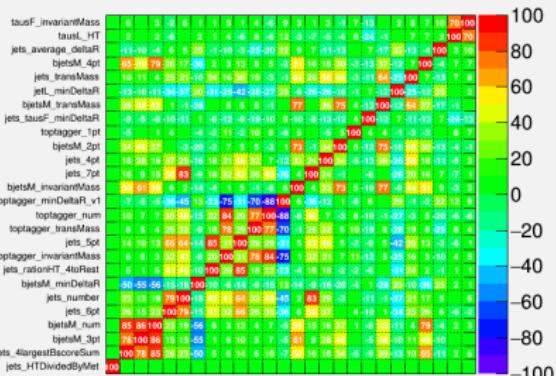
Correlation Matrix (background)

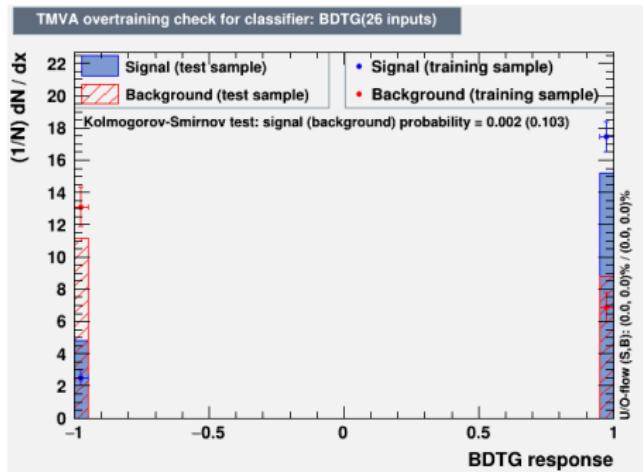
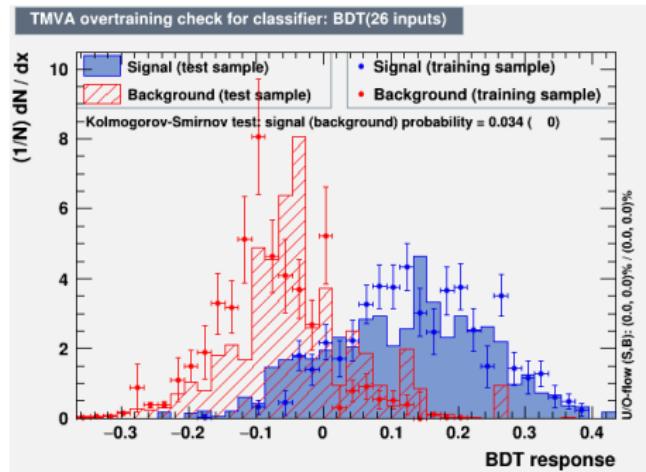
(26 input variables)



Correlation Matrix (signal)

(26 input variables)



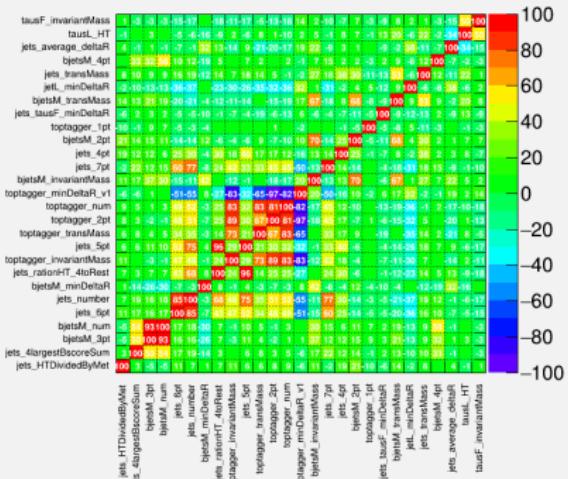


Results of all training

2tau1l

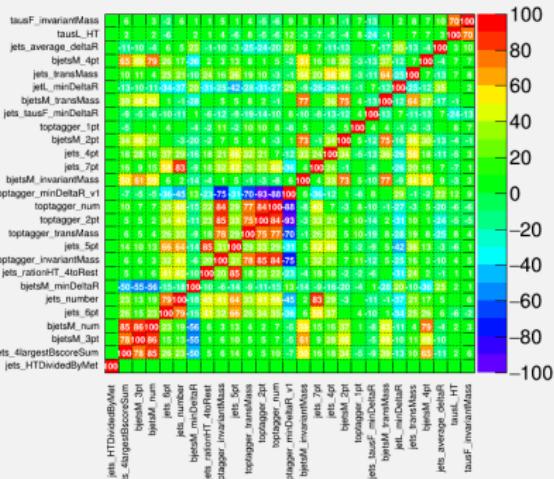
Correlation Matrix (background)

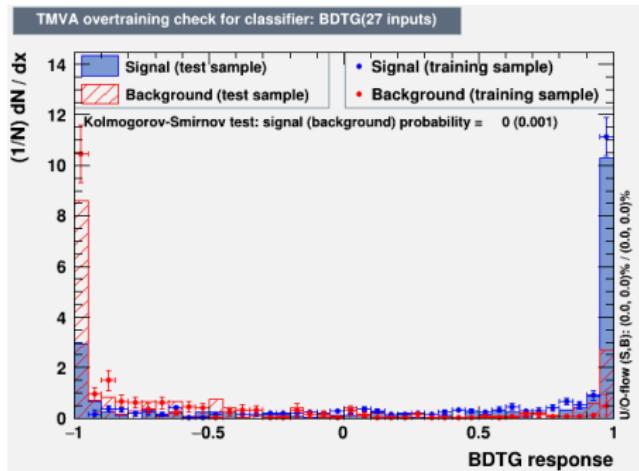
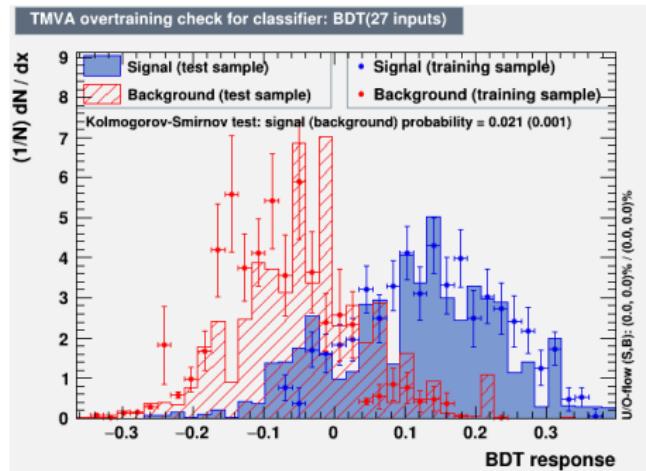
(27 input variables)



Correlation Matrix (signal)

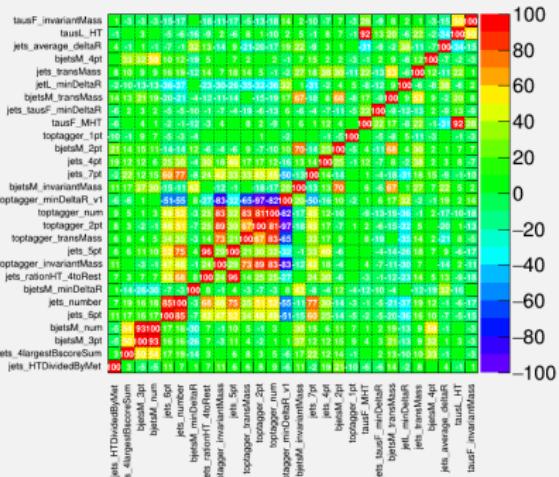
(27 input variables)





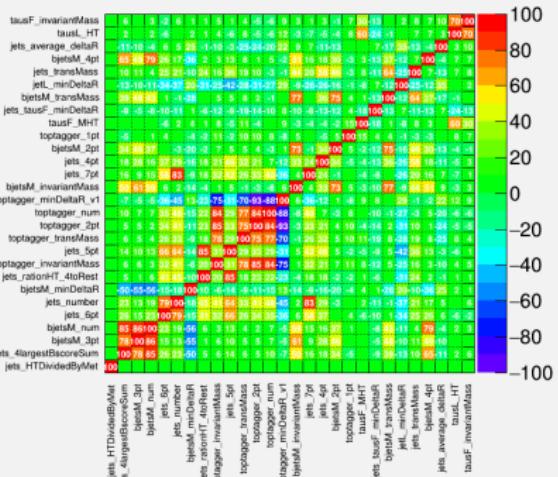
Correlation Matrix (background)

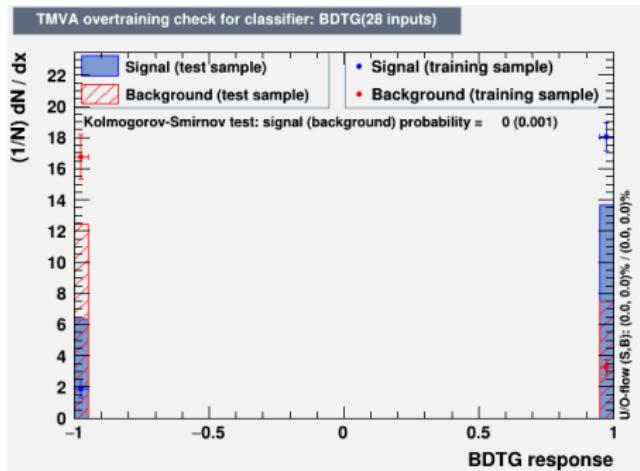
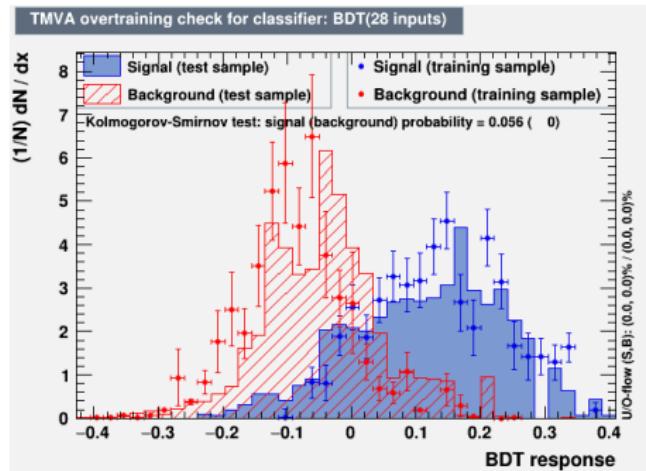
(28 input variables)



Correlation Matrix (signal)

(28 input variables)



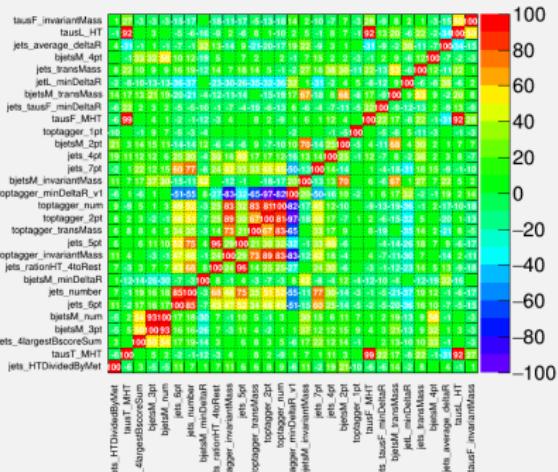


Results of all training

2tau1l

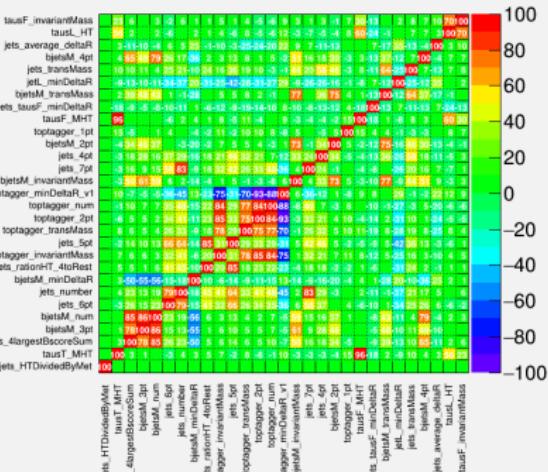
Correlation Matrix (background)

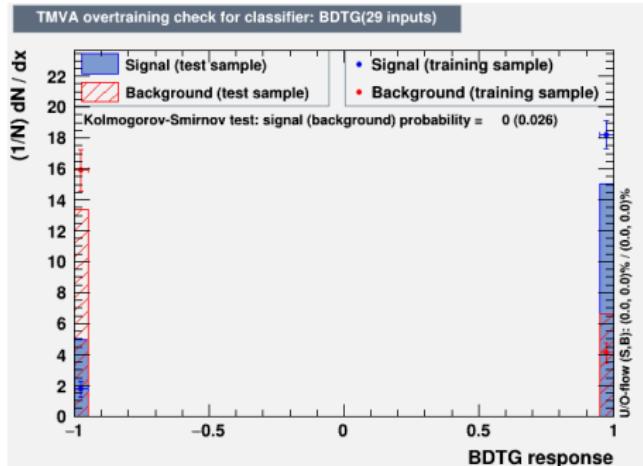
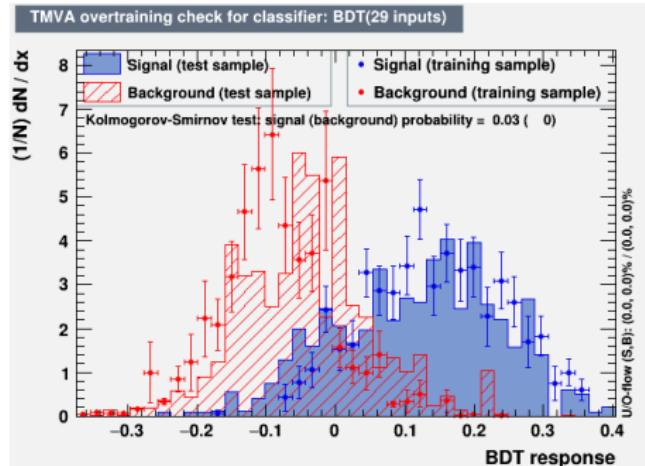
(29 input variables)



Correlation Matrix (signal)

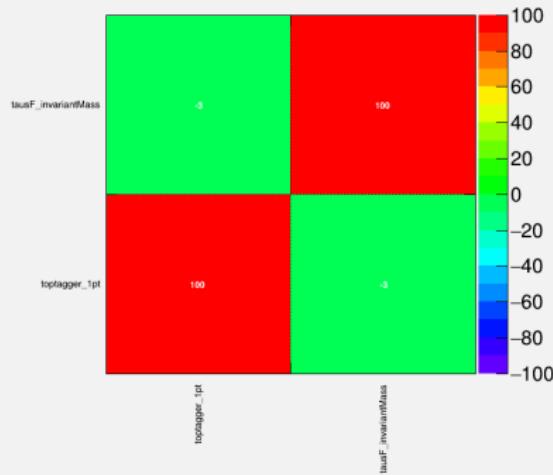
(29 input variables)



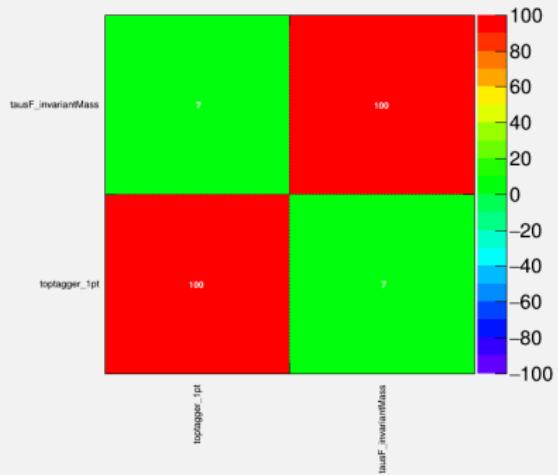


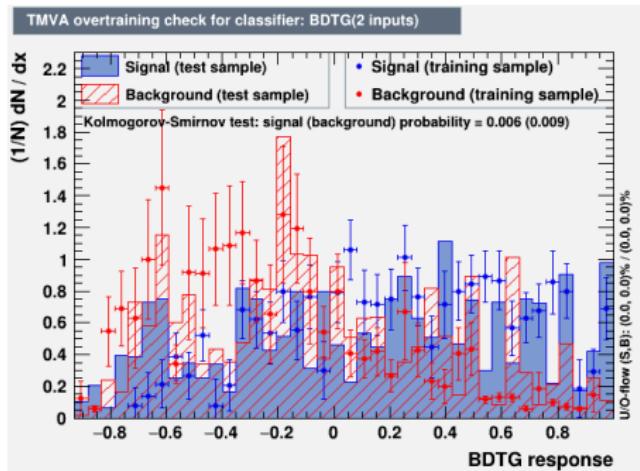
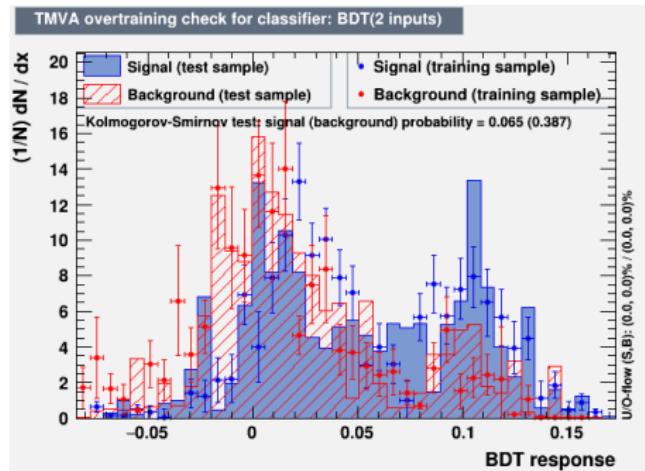
Correlation Matrix (background)

(2 input variables)

**Correlation Matrix (signal)**

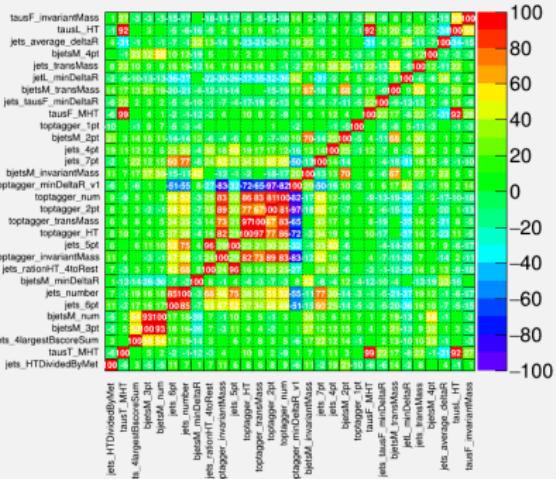
(2 input variables)





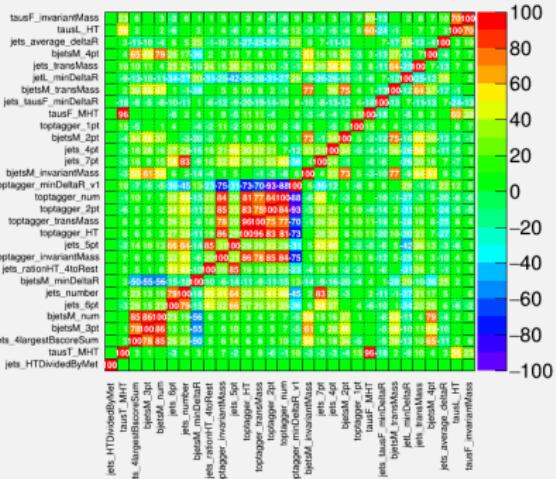
Correlation Matrix (background)

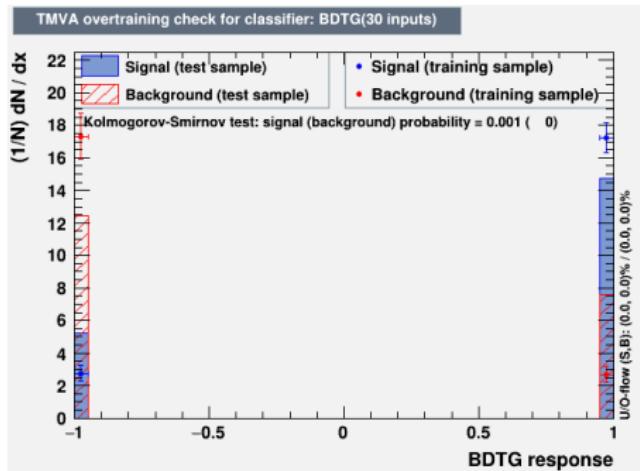
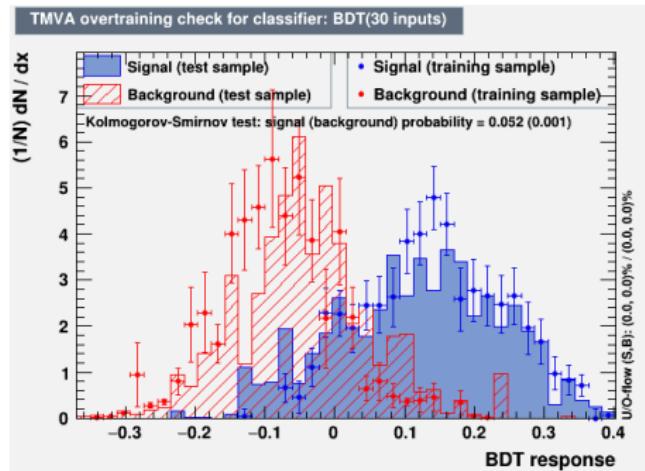
(30 input variables)



Correlation Matrix (signal)

(30 input variables)



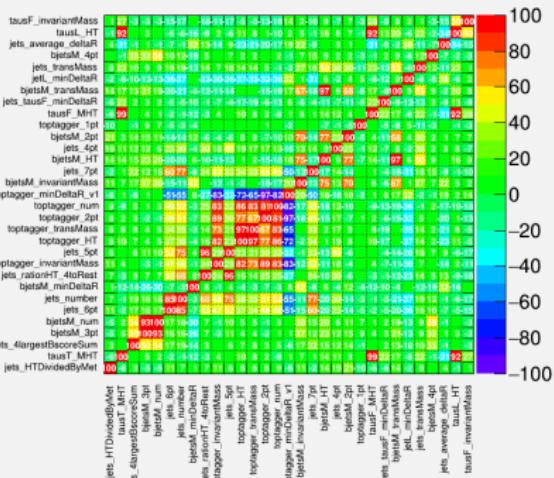


Results of all training

2tau1l

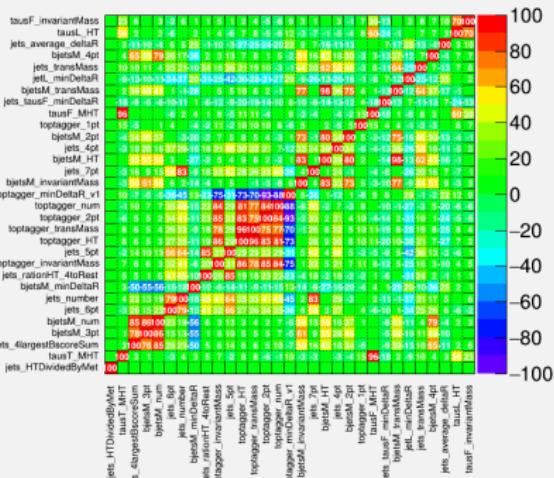
Correlation Matrix (background)

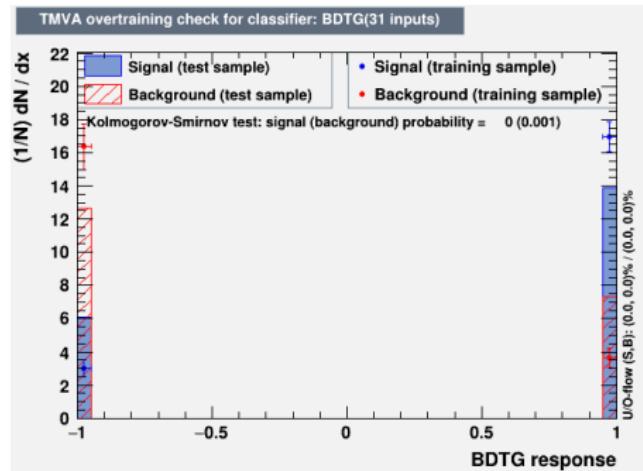
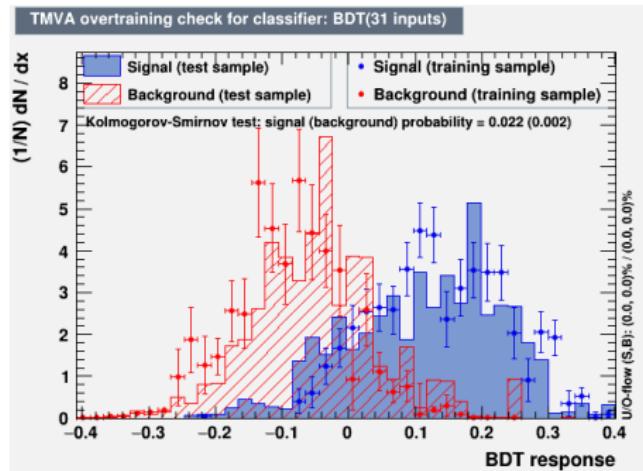
(31 input variables)



Correlation Matrix (signal)

(31 input variables)

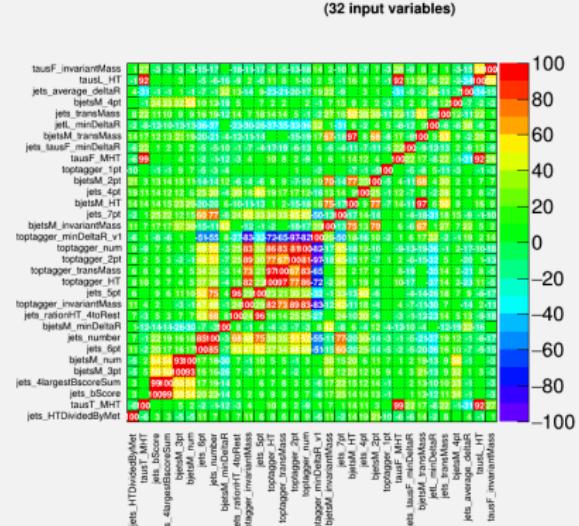




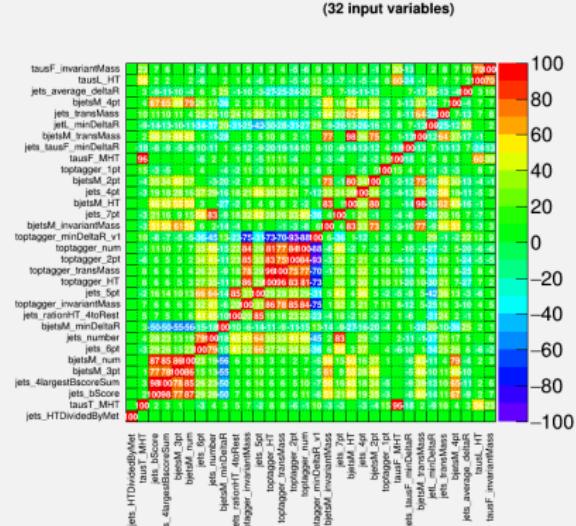
Results of all training

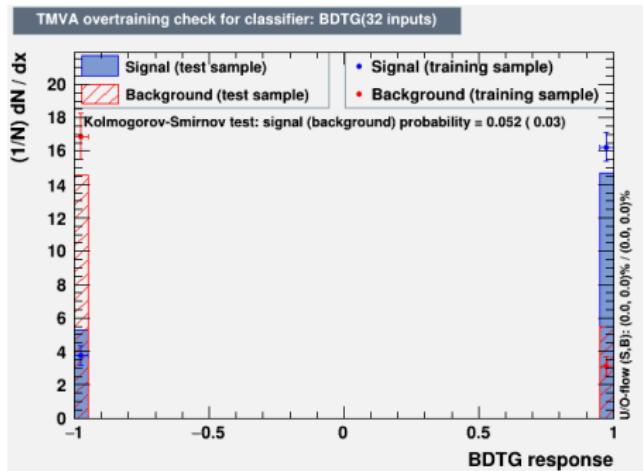
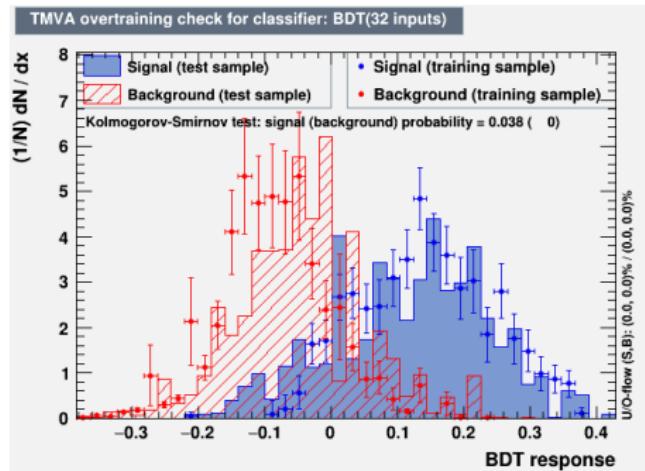
2tau1l

Correlation Matrix (background)



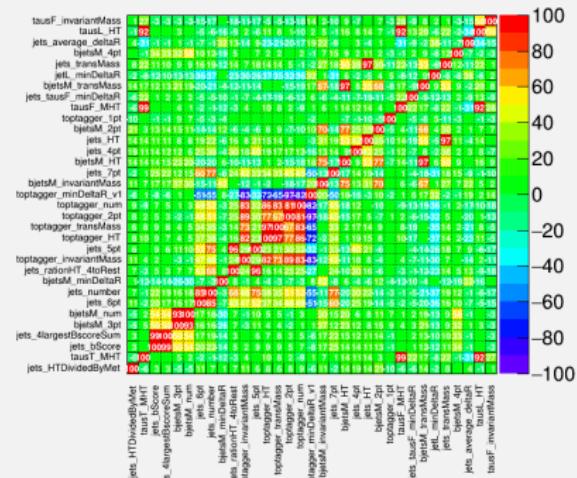
Correlation Matrix (signal)





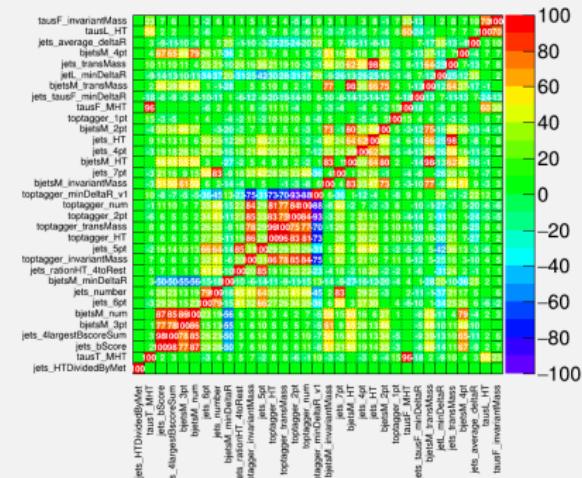
Correlation Matrix (background)

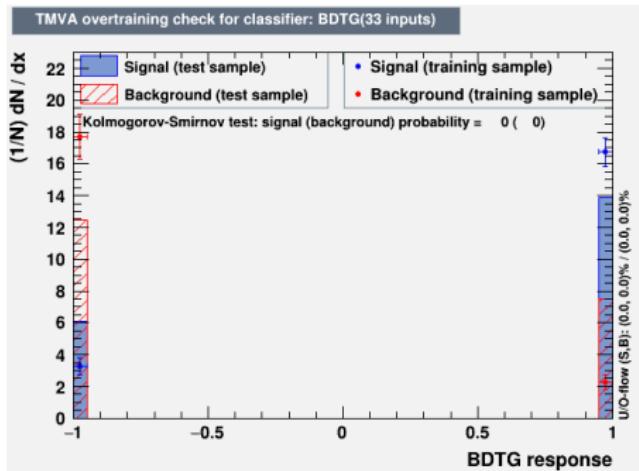
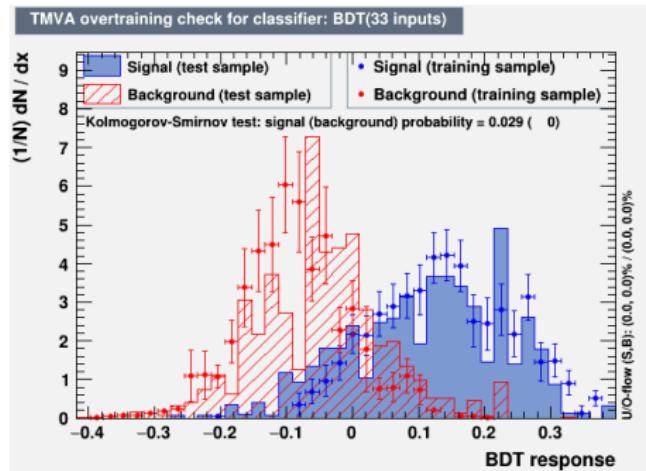
(33 input variables)



Correlation Matrix (signal)

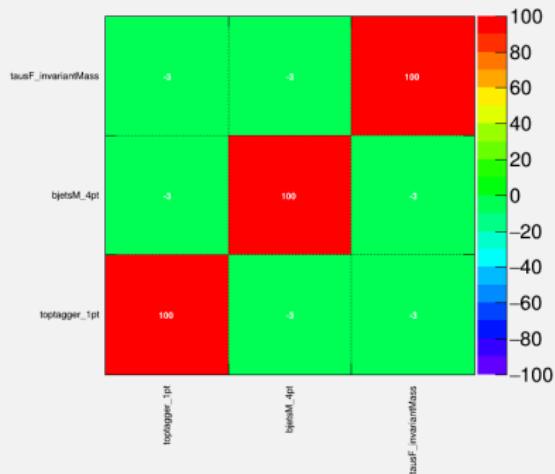
(33 input variables)



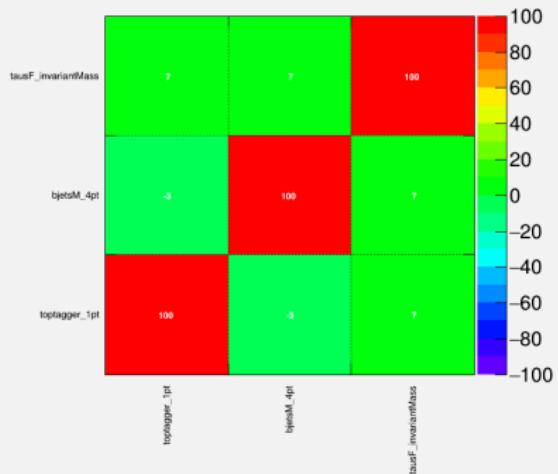


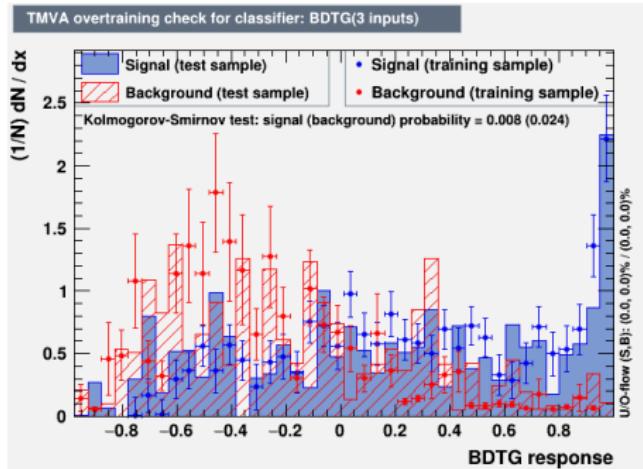
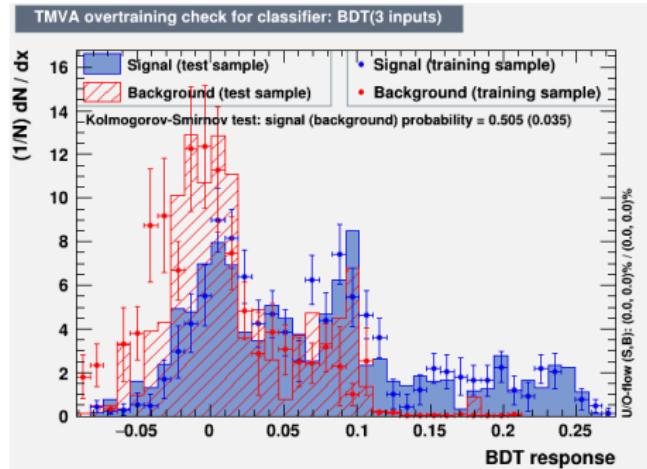
Correlation Matrix (background)

(3 input variables)

**Correlation Matrix (signal)**

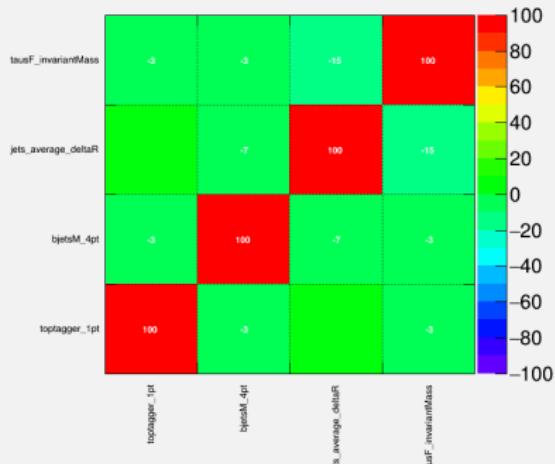
(3 input variables)





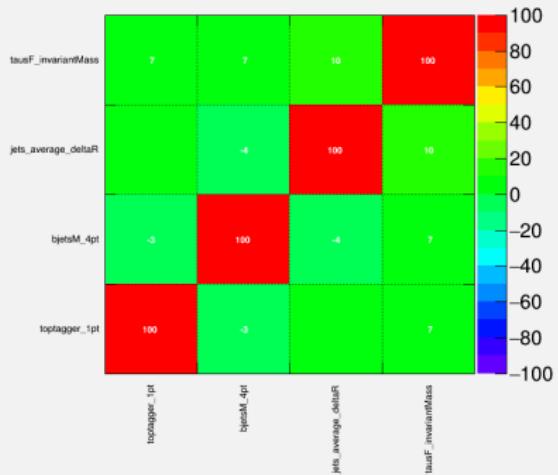
Correlation Matrix (background)

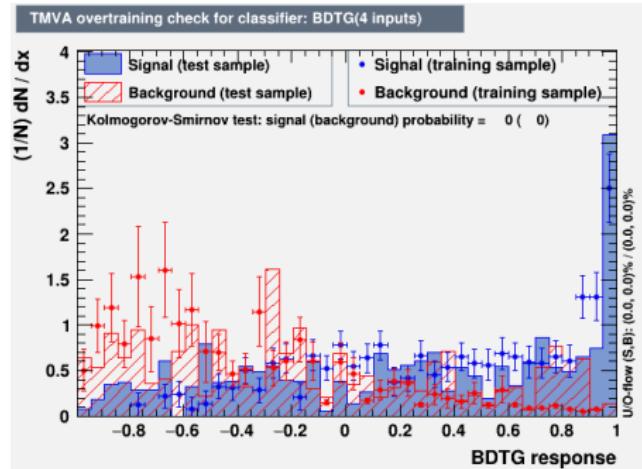
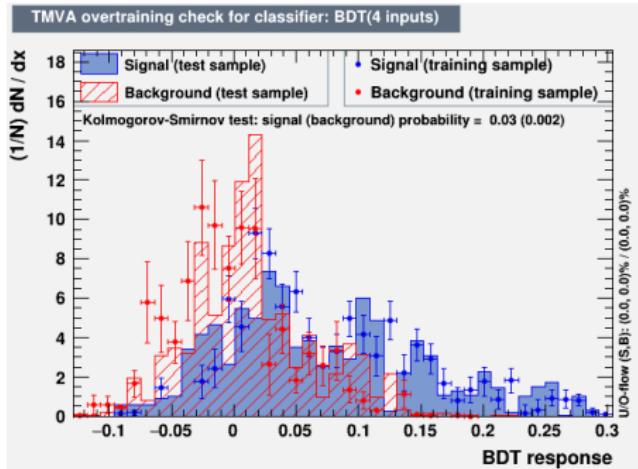
(4 input variables)



Correlation Matrix (signal)

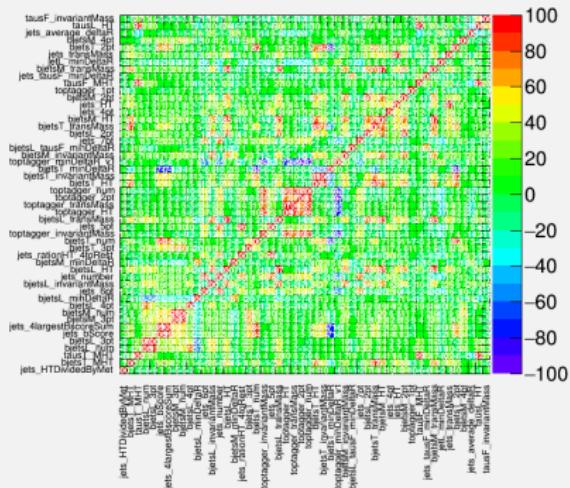
(4 input variables)





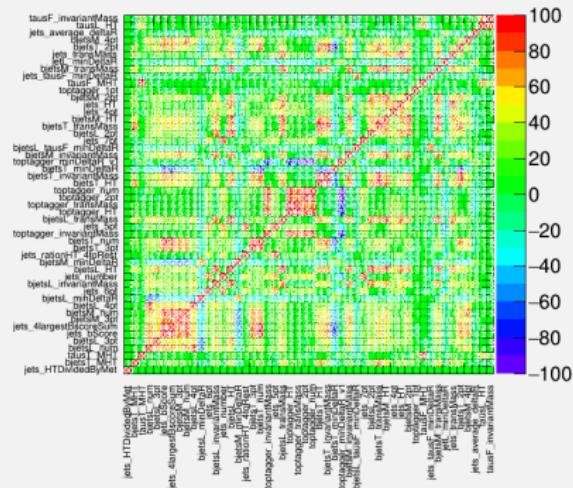
Correlation Matrix (background)

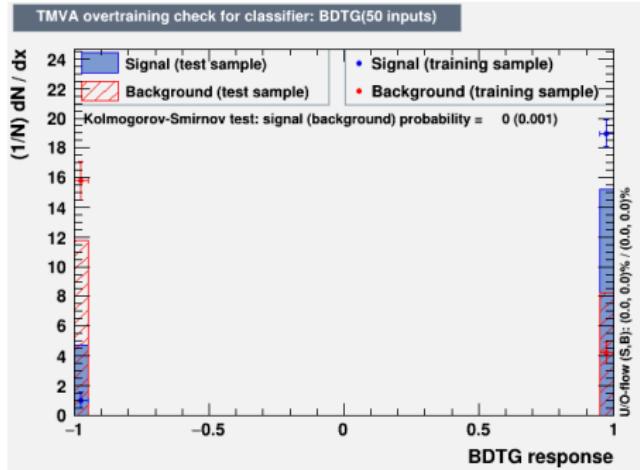
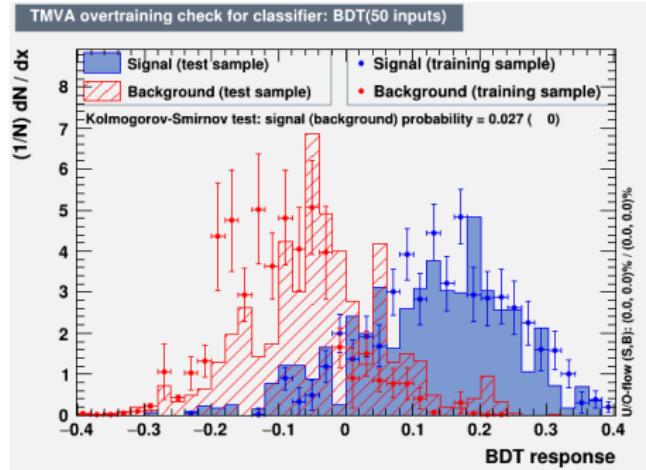
(50 input variables)



Correlation Matrix (signal)

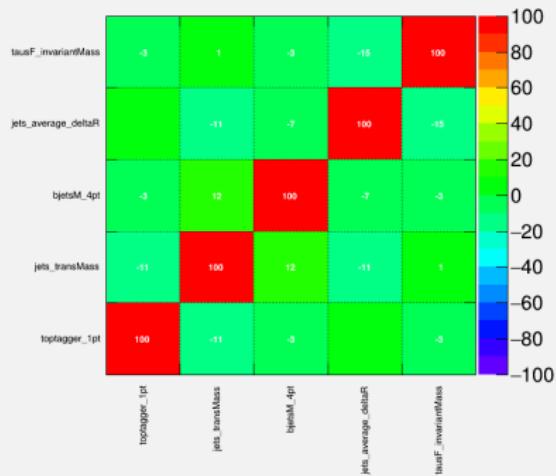
(50 input variables)





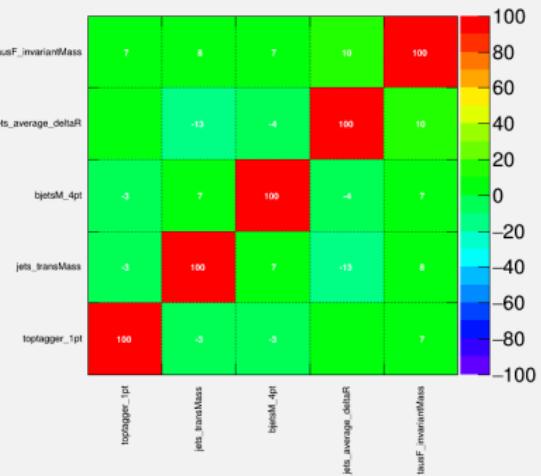
Correlation Matrix (background)

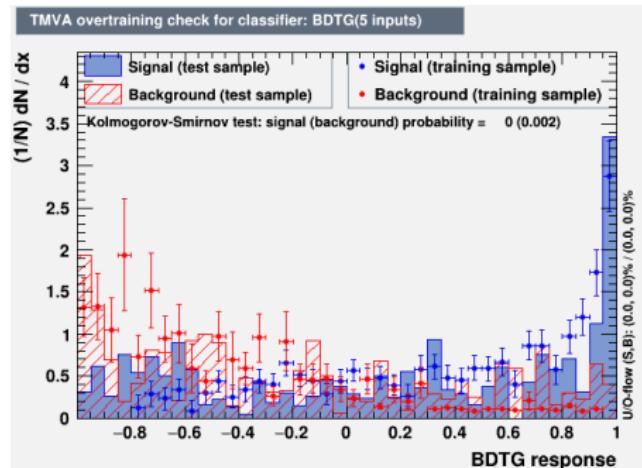
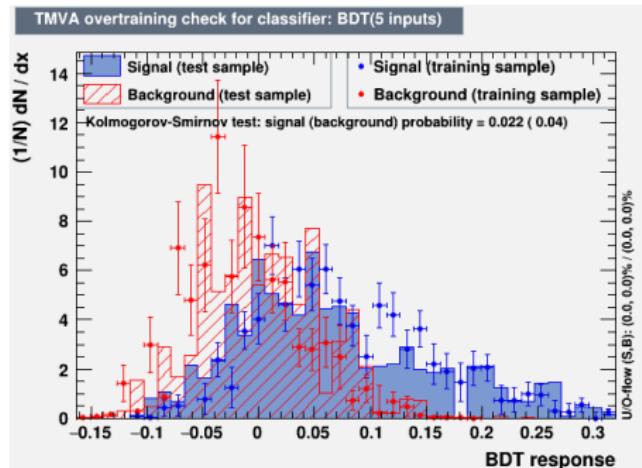
(5 input variables)



Correlation Matrix (signal)

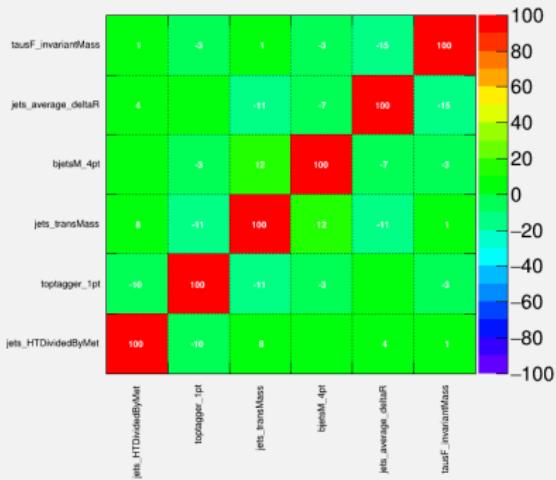
(5 input variables)





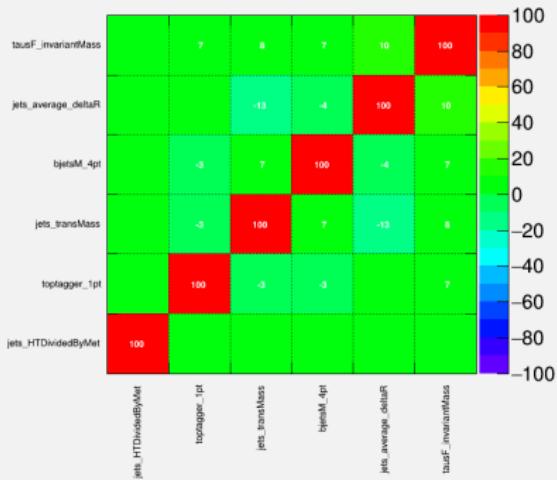
Correlation Matrix (background)

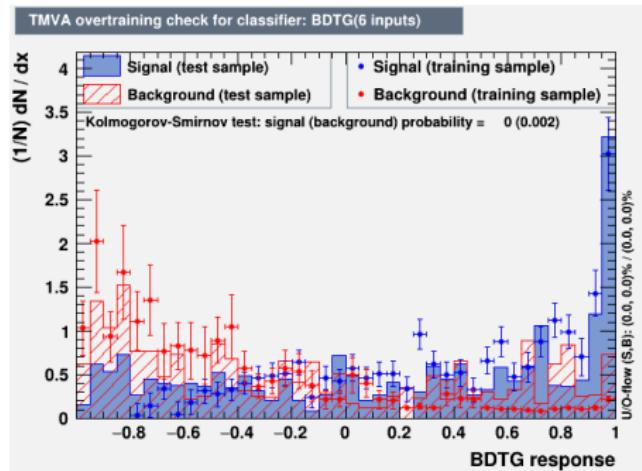
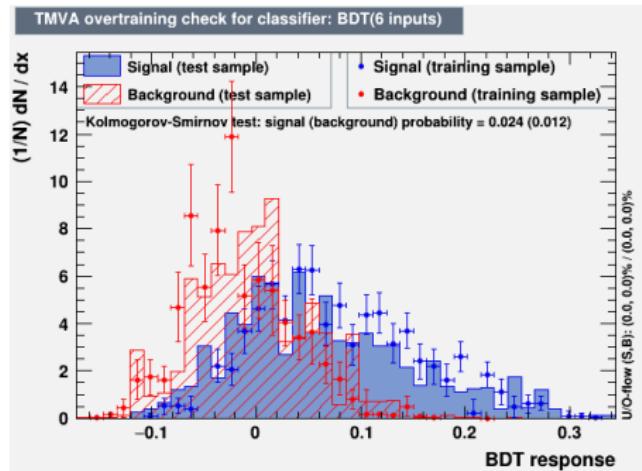
(6 input variables)



Correlation Matrix (signal)

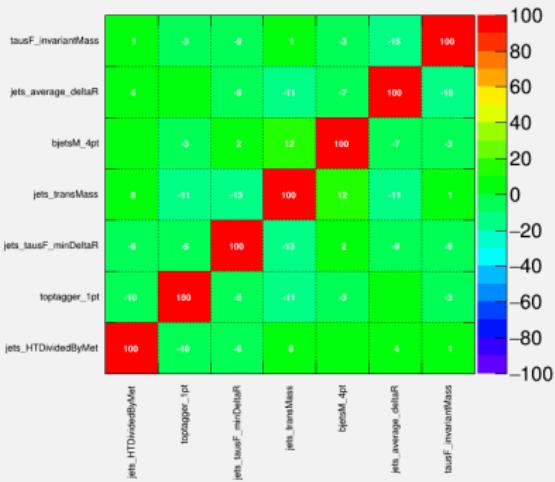
(6 input variables)





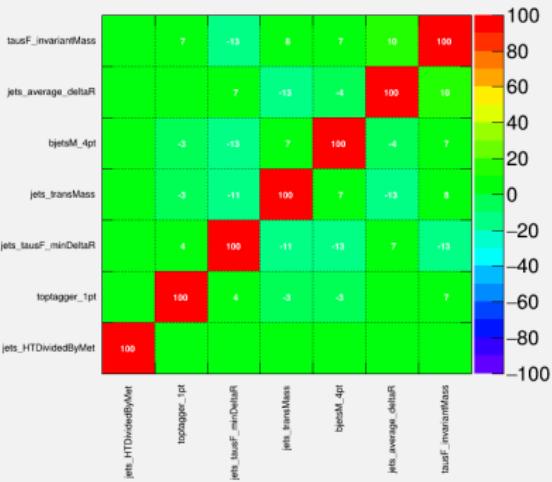
Correlation Matrix (background)

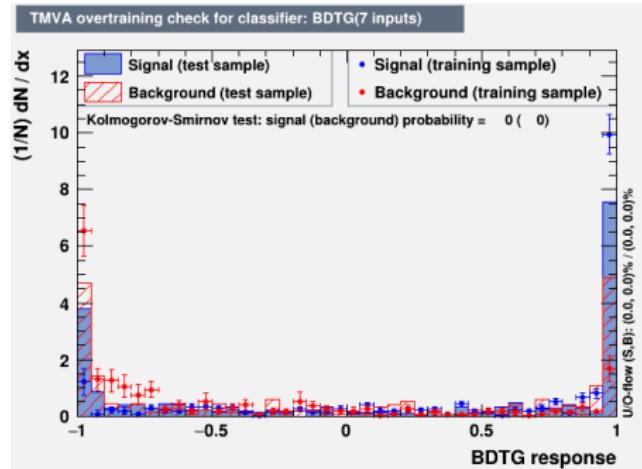
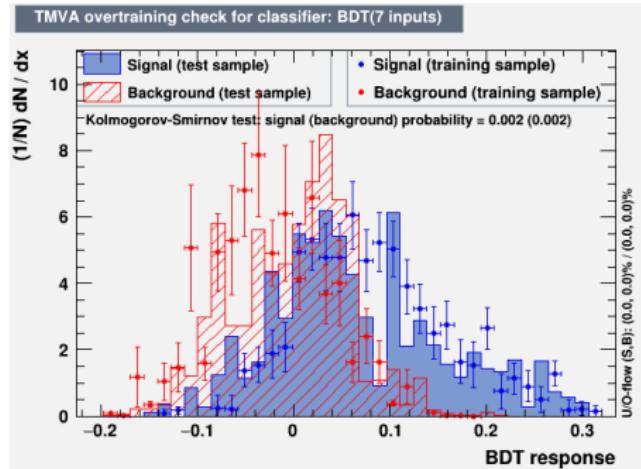
(7 input variables)



Correlation Matrix (signal)

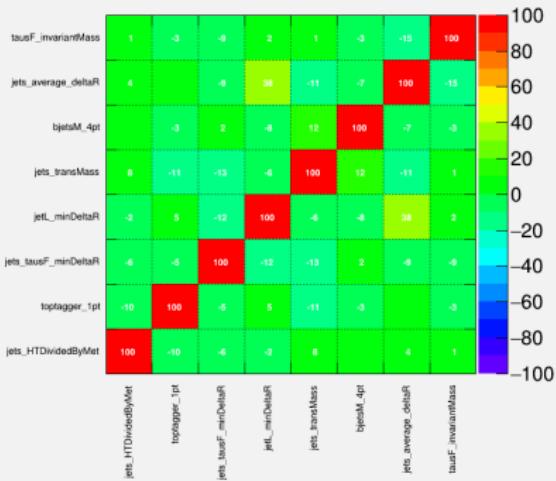
(7 input variables)





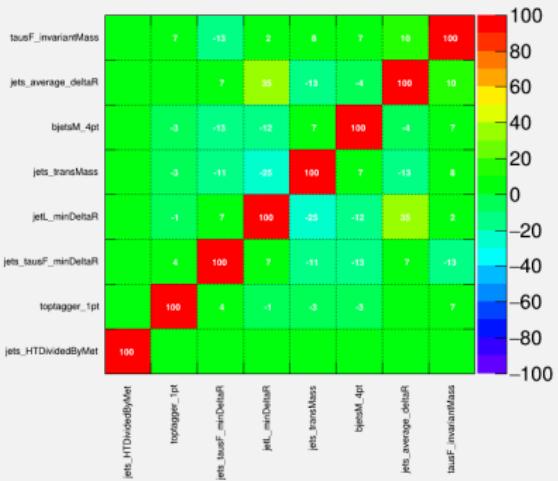
Correlation Matrix (background)

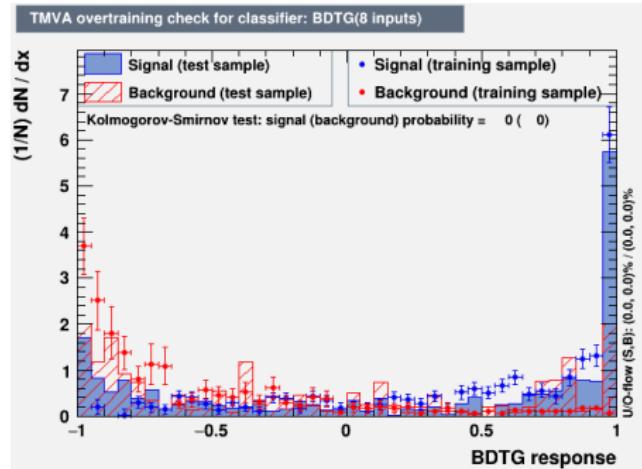
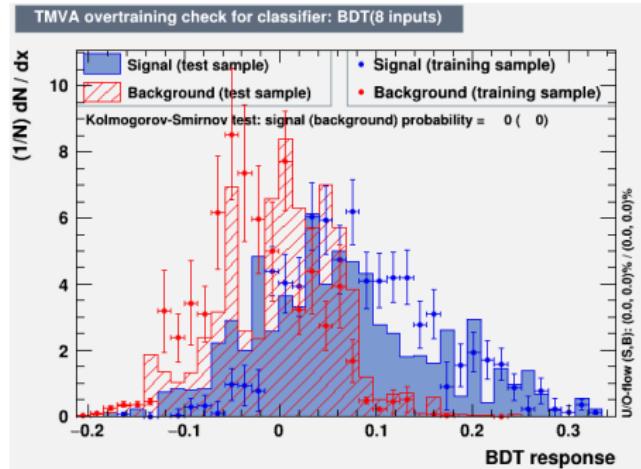
(8 input variables)



Correlation Matrix (signal)

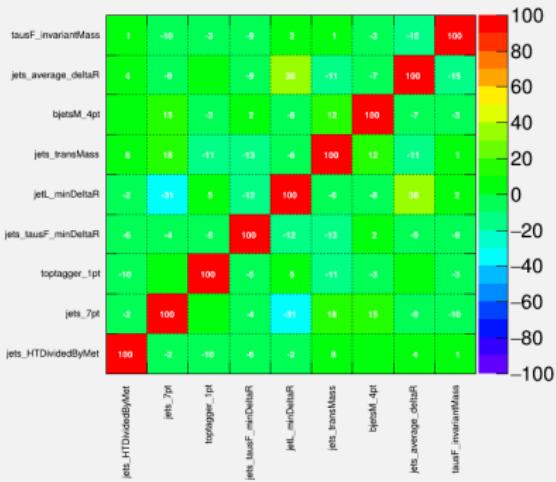
(8 input variables)





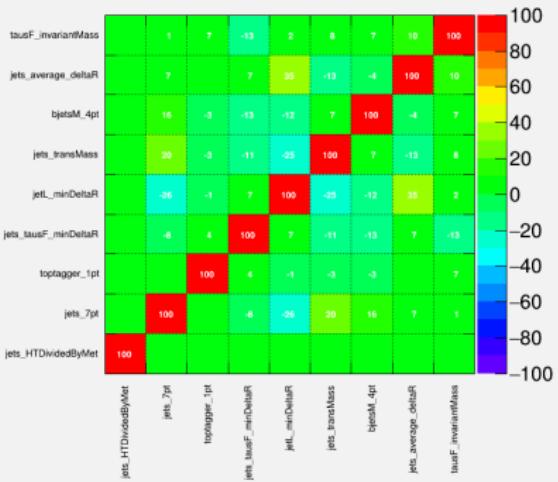
Correlation Matrix (background)

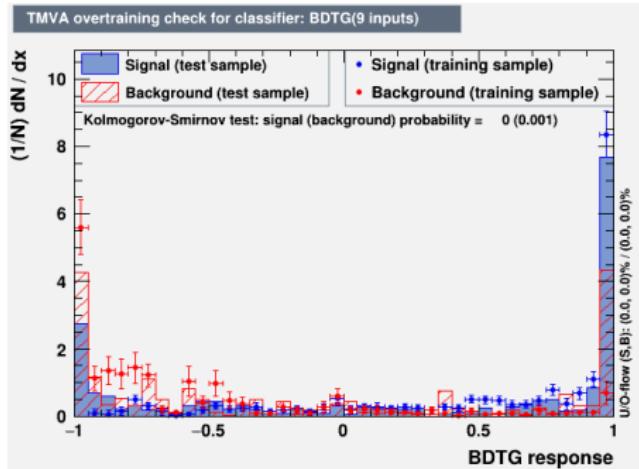
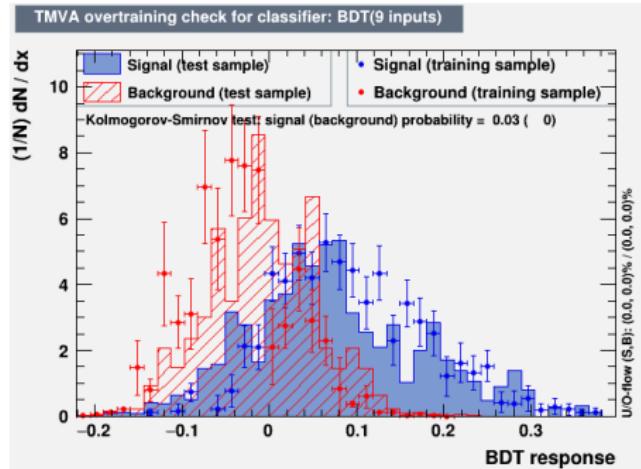
(9 input variables)

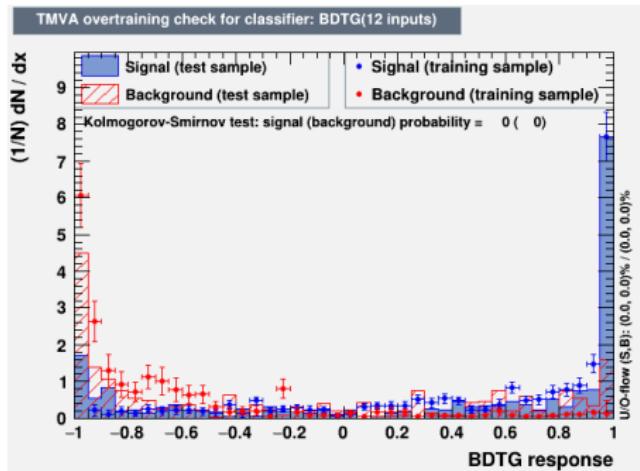
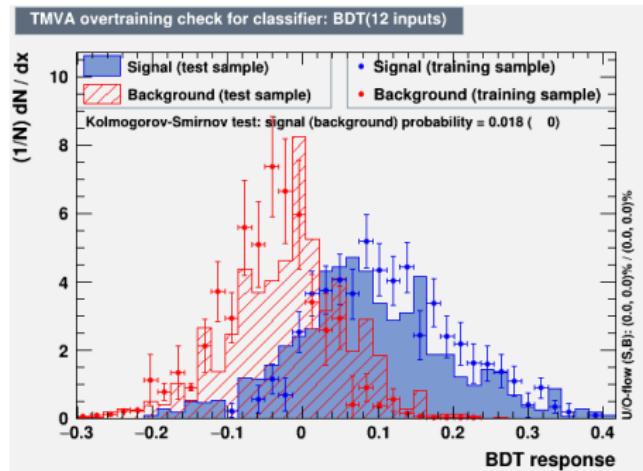


Correlation Matrix (signal)

(9 input variables)

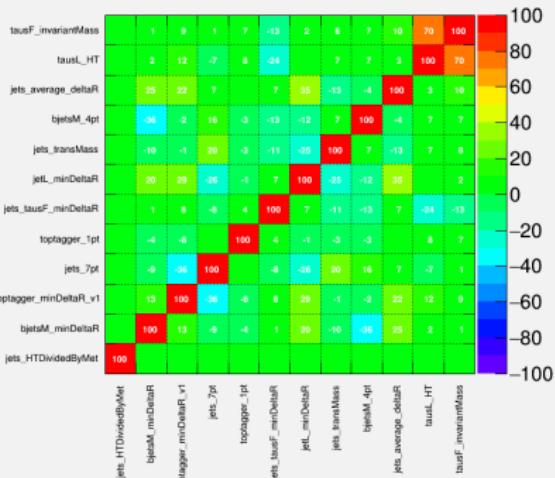






Correlation Matrix (signal)

(12 input variables)



Correlation Matrix (background)

(12 input variables)

