

tth study

Lepton ID with BDT

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training and test sample

signal : e, mu, tau(e), tau(mu), tau(1-prong), tau(3-prong)

training and test samples: $t\bar{t}h \rightarrow 2l2nbbbb$

background: mu, tau(e), tau(mu), tau(1-prong), tau(3-prong), b jet, lf jet

training and test samples: ttZ for light flavor jet

: $t\bar{t}h \rightarrow 2l2nbbbb$ for the other background

- PFOs which can be traced to MC information are used to make samples.

BDTs: Backgrounds

	e	mu	tau(e)	tau(mu)	tau 1-prong	tau 3-prong	bjet	lf jet
e	-	x	x	x	x	x	x	x
mu		-	x	x	x	x	x	x
tau(e)			-	x	x	x	x	x
tau(mu)				-	x	x	x	x
tau(1-prong)					-	x	x	x
tau(3-prong)						-	x	x

Input variables

Input variables are chosen from the following parameters

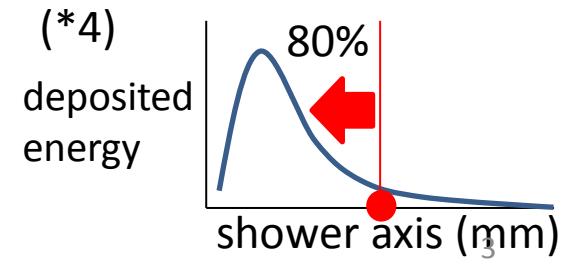
- hadOvEM: $E_{\text{hcal}}/E_{\text{ecal}}$
- calEovE: $(E_{\text{hcal}}+E_{\text{ecal}})/E_{\text{pfo}}$
- coneE2woSeed: E_{cone2} without seed E_{PFO}
- isoCutOld: $6(E_{\text{PFO}}-15)^2 - (\text{coneE2woSeed})^2$
- pfoRO : $\sqrt{(\text{trkD}0^2 + \text{trkZ}0^2)}$
- coneE1OvConeE2: $E_{\text{cone1}}/E_{\text{cone2}}$
- coneMass1: reconstructed mass with PFOs in cone1
- coneMass3: reconstructed mass with PFOs in cone3
- clusterShape0: χ^2 of fit
- clusterShape1: maximum deposited energy (GeV)
- clusterShape2: shower Max (mm)
- clusterShape3: transverse absorption length(mm)
- clusterShape5: shower Max/ Expected shower Max
- clusterShape16: xl20 (mm)
- yokuE: deposited energy in the yoku
- pfOE: PFO energy
- pt: Pt of PFO
- cone1E
- maxTrkEInCone13: Maximum energy of a PFO with track between cone1 and cone2
- nNeutralCone1: Number of PFOs with no track in cone1
- eNeutralCone1: Energy sum of PFOs with no track in cone1

(*1) cone1: $\cos\theta > 0.99$
cone2: $\cos\theta > 0.98$
cone3: $\cos\theta > 0.93$

(*2) cluster shape variables
- choose the highest energy cluster
- electron shower shaped is used to fit

(*3) transverse absorption length :
distance btw shower center
and location where cluster energy
goes down to $1/e$

(*4) xl20:length to the position where
the deposited energy reaches 80 % of
total energy on shower axis

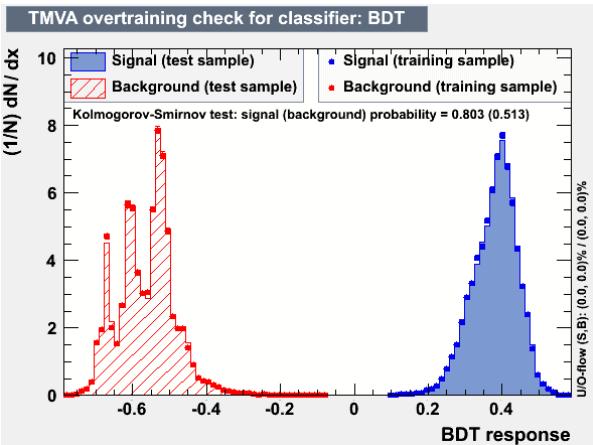


BDT Output, signal: electron

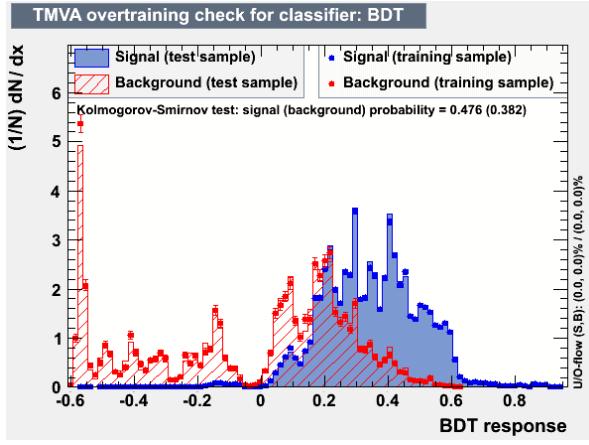
pre-cut : PFO energy > 2 GeV, PFO with track

additional pre-cut for electron or muon: PFO energy > 5 GeV

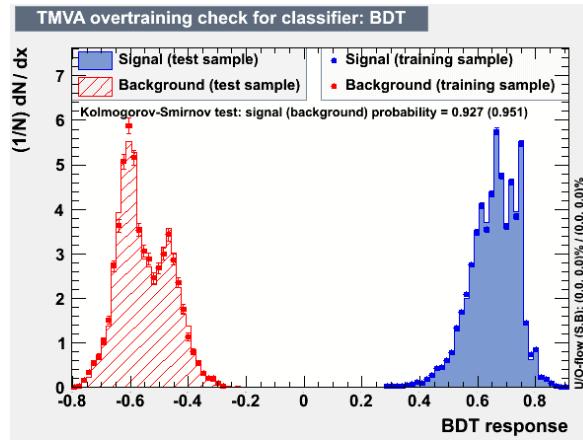
background: muon



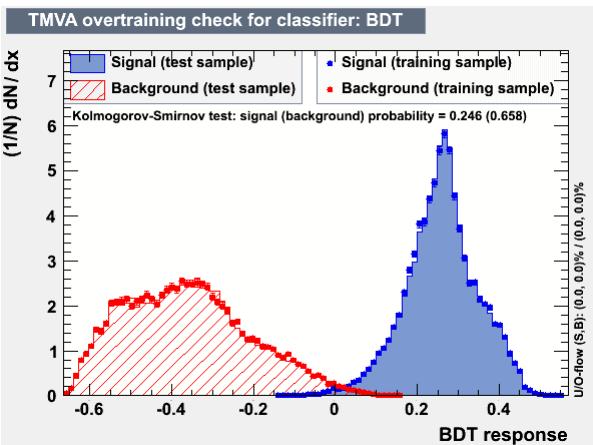
background: tau(e)



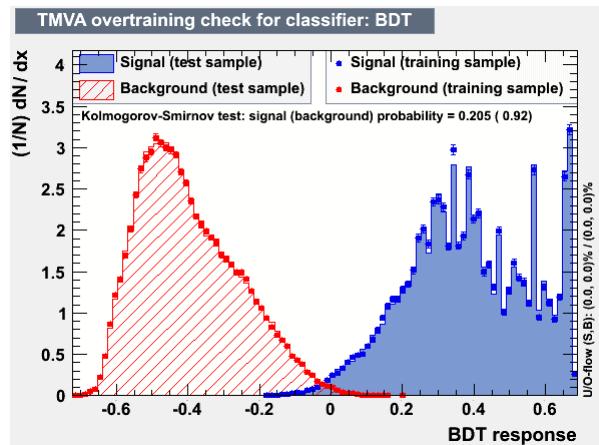
background: tau (μ)



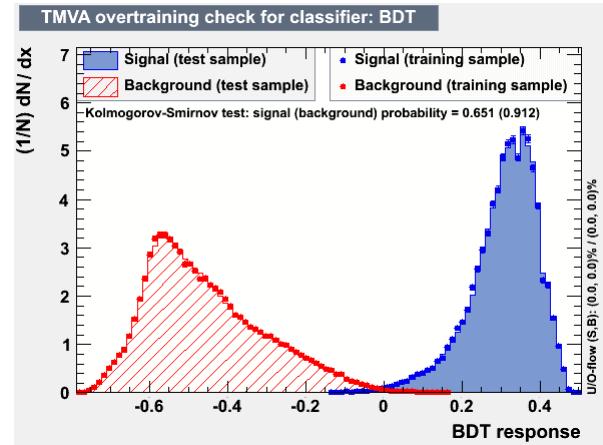
background: tau(h)



background: b jet



background: lf jet



BDT Output, signal: muon

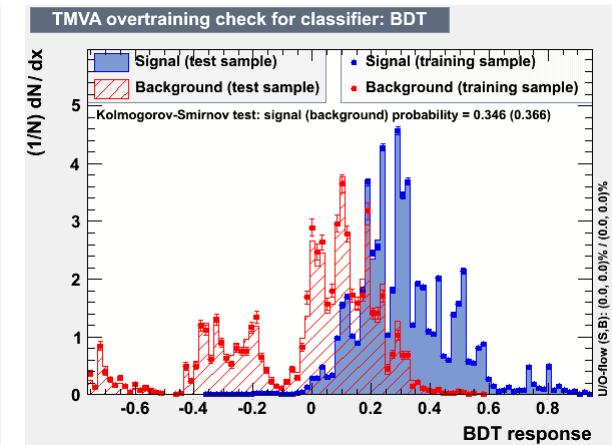
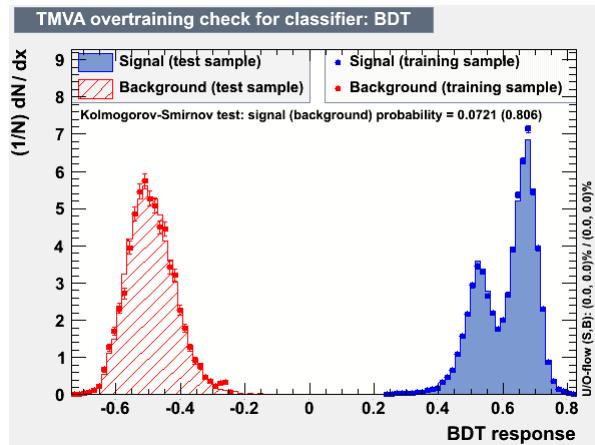
pre-cut : PFO energy > 2 GeV, PFO with track

additional pre-cut for electron or muon: PFO energy > 10 GeV

background: muon

background: tau(e)

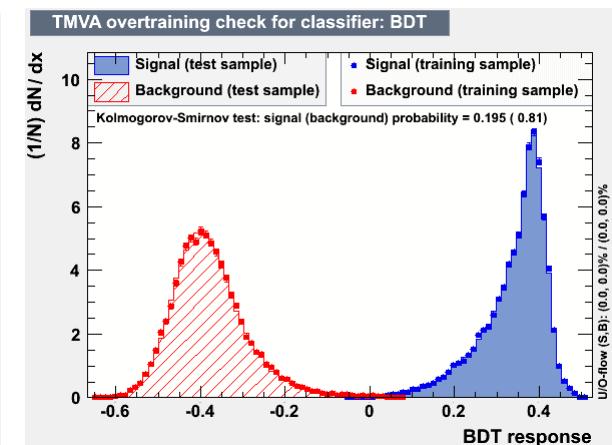
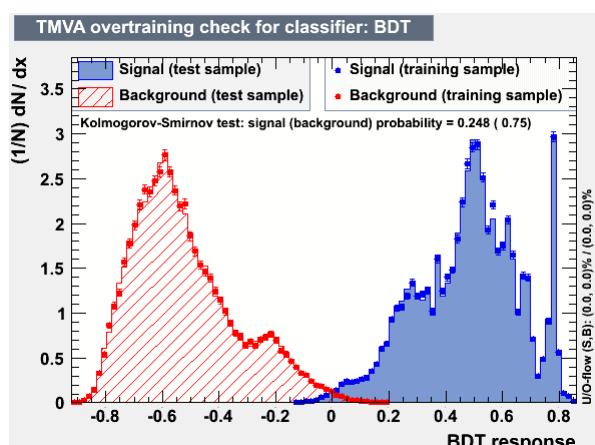
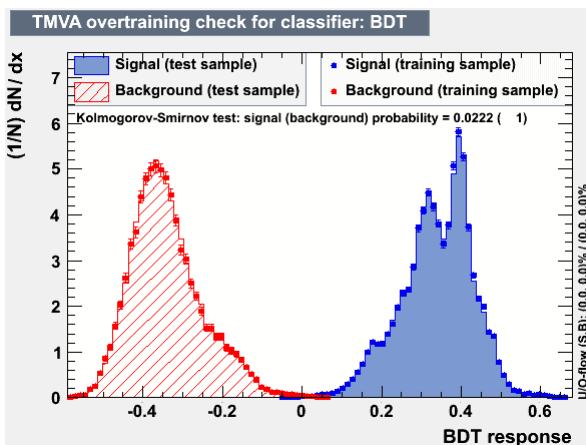
background: tau (μ)



background: tau(h)

background: b jet

background: lf jet



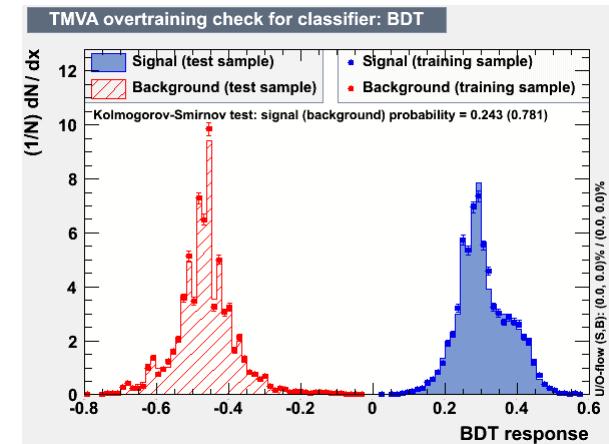
BDT Output, signal: tau(e)

pre-cut : PFO energy > 2 GeV, PFO with track

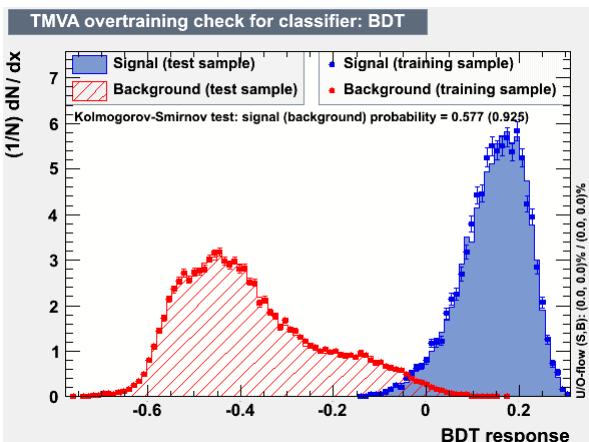
background: muon

background: tau(e)

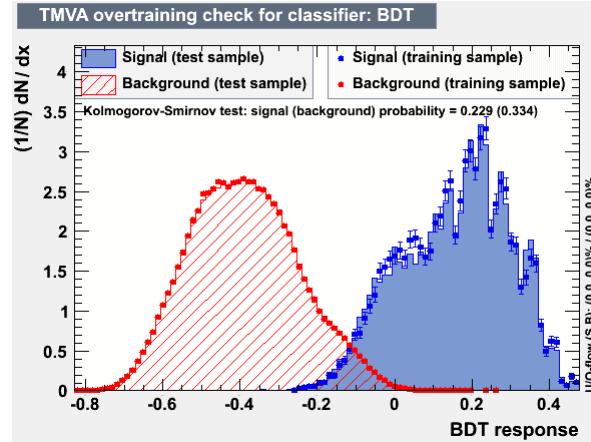
background: tau (μ)



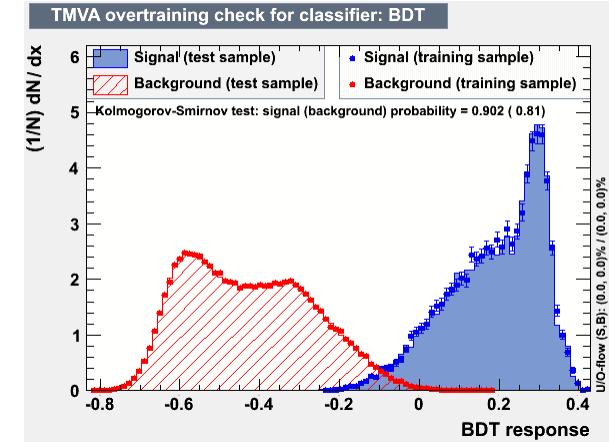
background: tau(h)



background: b jet



background: lf jet



BDT Output, signal: tau(m)

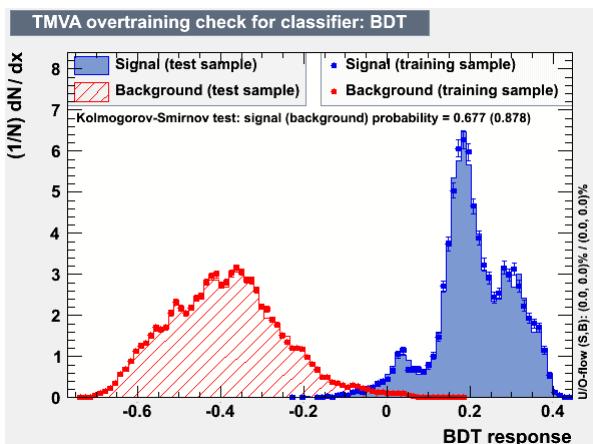
pre-cut : PFO energy > 2 GeV, PFO with track

background: muon

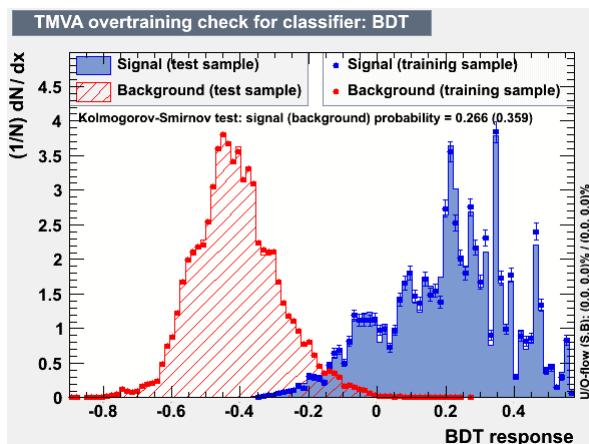
background: tau(e)

background: tau (μ)

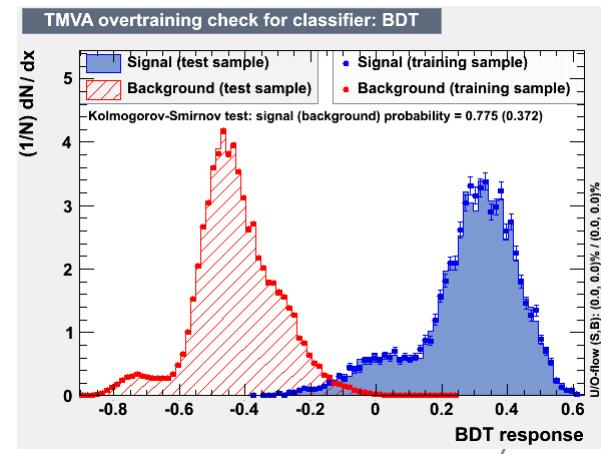
background: tau(h)



background: b jet



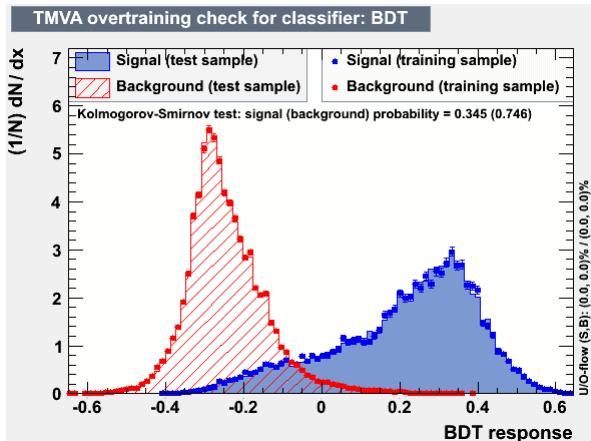
background: lf jet



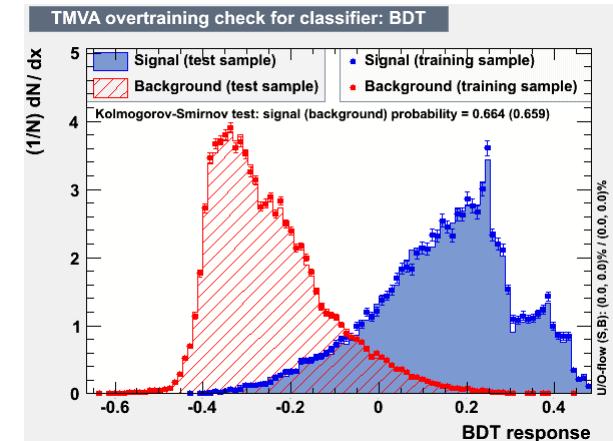
BDT Output, signal: tau 1-prong (top), tau 3-prong (bottom)

pre-cut : PFO energy > 2 GeV, PFO with track

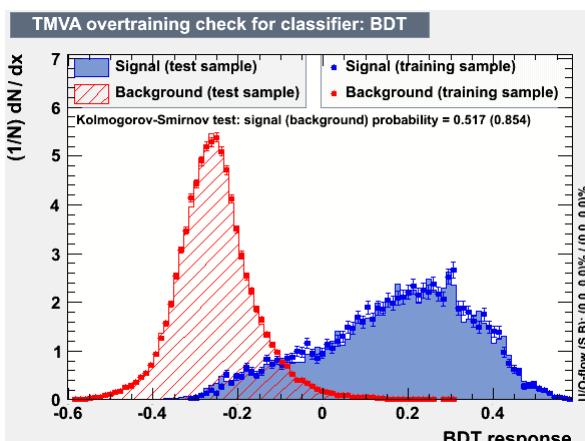
background: b jet



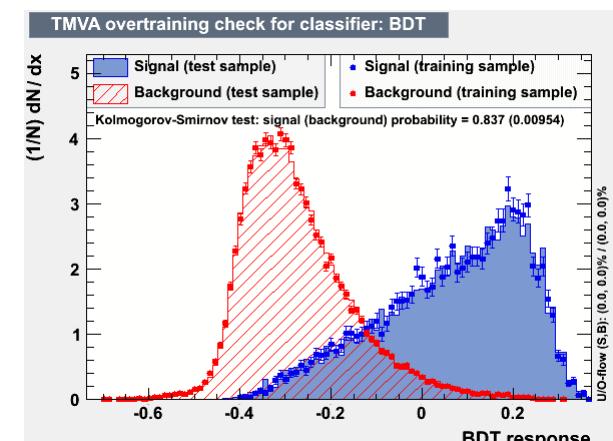
background: lf jet



background: b jet



background: lf jet



tth 2l2n

- Lepton ID efficiency with TMVA BDT (cut base) lepton selection

particles

* in this table,
0 means less than 0.01%

Selection (%)	elec	muon	taue	taum	tauh1	tauh3	bjet	ljet
elec	92 (85.08)	0 (0)	43.42 (28.82)	0 (0)	0.42 (0.31)	0 (0.06)	0 (0)	N/A
muon	0 (0)	95.11 (92.14)	0 (0)	40.36 (18.19)	0.03 (0.01)	0 (0)	0 (0)	N/A
taue	0.94 (2.24)	0 (0)	29.32 (18.76)	0 (0)	0.33 (0.42)	0 (0)	0.04 (0.02)	N/A
taum	0 (0)	1.34 (2.66)	0 (0)	34.22 (35.07)	0.11 (0.09)	0 (0)	0.04 (0.03)	N/A
tauh1	0.28 (3.56)	0.06 (0.53)	0.71 (15.4)	0.04 (12.46)	55.64 (46.21)	0 (0)	0.04 (0.06)	N/A
tauh3	0 (0)	0 (0.01)	0.04 (0.08)	0 (0.04)	0 (0)	49.29 (38.74)	0.01 (0.04)	N/A
nonlep	6.76 (9.09)	3.47 (4.65)	26.49 (36.91)	25.37 (34.22)	43.44 (52.92)	50.7 (61.18)	99.84 (99.83)	N/A

ttZ

- Lepton ID efficiency with TMVA BDT (cut base) lepton selection

	particles								* in this table, 0 means less than 0.01%
	(%)	elec	muon	taue	taum	tau $\mathrm{h}1$	tau $\mathrm{h}3$	bjet	ljet
elec		90.92 (84.62)	0.01 (0.01)	44.3 (28.27)	0 (0)	0.15 (0.11)	0 (0.11)	0.01 (0.02)	0.01 (0.02)
		0 (0)	94.93 (92.23)	0 (0)	39.98 (18.28)	0 (0)	0.11 (0)	0.01 (0)	0 (0.01)
muon		1.16 (1.96)	0 (0.01)	28.08 (20.01)	0 (0)	0.34 (0.23)	0 (0)	0.02 (0.02)	0 (0)
		0 (0)	1.59 (2.93)	0 (0)	33.42 (36.28)	0.15 (0.07)	0 (0)	0.02 (0.03)	0 (0)
taue		0.31 (3.14)	0.05 (0.49)	0.56 (15.08)	0 (10.98)	54.97 (45.37)	0 (0)	0.01 (0.02)	0.38 (0.4)
		0.09 (0.05)	0 (0)	0 (0.08)	0 (0)	0 (0)	48.14 (37.99)	0 (0.02)	0.18 (0.2)
taum		7.5 (10.2)	3.39 (4.29)	27.03 (36.62)	26.59 (34.44)	44.36 (54.19)	51.73 (61.88)	99.89 (99.86)	99.4 (99.34)
		0.09 (0.05)	0 (0)	0 (0.08)	0 (0)	0 (0)	48.14 (37.99)	0 (0.02)	0.18 (0.2)
nonlep		7.5 (10.2)	3.39 (4.29)	27.03 (36.62)	26.59 (34.44)	44.36 (54.19)	51.73 (61.88)	99.89 (99.86)	99.4 (99.34)
		0.09 (0.05)	0 (0)	0 (0.08)	0 (0)	0 (0)	48.14 (37.99)	0 (0.02)	0.18 (0.2)

BDT input variables table 1

	e-m	e-taue	e-taum	e-tauh	e-bjet	e-lfjet	m-taue	m-taum	m-tauh	m-bjet	m-lfjet
hadOvEM	✓		✓	✓	✓	✓					
calEovE	✓	✓	✓			✓	✓		✓	✓	✓
coneE2woSeed		✓				✓		✓			
isoCutOld		✓	✓	✓		✓	✓		✓	✓	✓
pfoR0	✓	✓		✓	✓	✓		✓		✓	
coneE1OvConeE2					✓	✓	✓				
coneMass1	✓			✓	✓	✓	✓				✓
coneMass3		✓	✓	✓	✓	✓	✓	✓	✓	✓	✓
clusterShape0	✓	✓	✓	✓		✓	✓				✓
clusterShape1	✓		✓	✓	✓	✓	✓				✓
clusterShape2	✓		✓		✓	✓	✓				✓
clusterShape3	✓	✓	✓			✓		✓		✓	✓
clusterShape5	✓						✓				✓
clusterShape16	✓		✓	✓		✓	✓		✓		
yokuE	✓		✓					✓	✓		✓
pfoe			✓	✓	✓	✓	✓	✓	✓	✓	✓
pt							✓		✓	✓	✓
cone1E		✓			✓	✓					✓
nTrkInCone1	✓				✓	✓					
maxTrkEInCone13	✓			✓		✓					✓
nNeutralCone1				✓		✓			✓		✓
eNeutralCone1	✓			✓		✓			✓	✓	11

	taue-taum	taue-tauh	taue-bjet	taue-lfjet	taum-tauh	taum-bjet	taum-lfjet	tauh1-bjet	tauh1-lfjet	tauh3-bjet	tauh3-lfjet
hadOvEM	✓	✓	✓	✓	✓	✓	✓	✓			
calEovE		✓	✓	✓	✓	✓				✓	
coneE2woSeed		✓					✓	✓	✓	✓	
isoCutOld	✓	✓	✓	✓	✓	✓		✓		✓	
pfoR0		✓	✓	✓			✓	✓	✓	✓	✓
coneE1OvConeE2	✓	✓		✓	✓			✓	✓	✓	✓
coneMass1		✓						✓	✓	✓	✓
coneMass3		✓	✓	✓		✓	✓	✓	✓	✓	✓
clusterShape0	✓	✓	✓								
clusterShape1		✓	✓	✓			✓			✓	
clusterShape2			✓			✓				✓	
clusterShape3	✓	✓		✓	✓		✓	✓	✓	✓	✓
clusterShape5	✓	✓			✓						
clusterShape16	✓	✓	✓	✓							
yokuE					✓	✓	✓	✓		✓	
pfoe		✓	✓	✓	✓		✓		✓	✓	✓
pt									✓	✓	
cone1E	✓		✓	✓			✓	✓		✓	✓
nTrkInCone1	✓	✓	✓								
maxTrkEInCone13	✓	✓	✓					✓		✓	
nNeutralCone1								✓			
eNeutralCone1								✓		✓	12

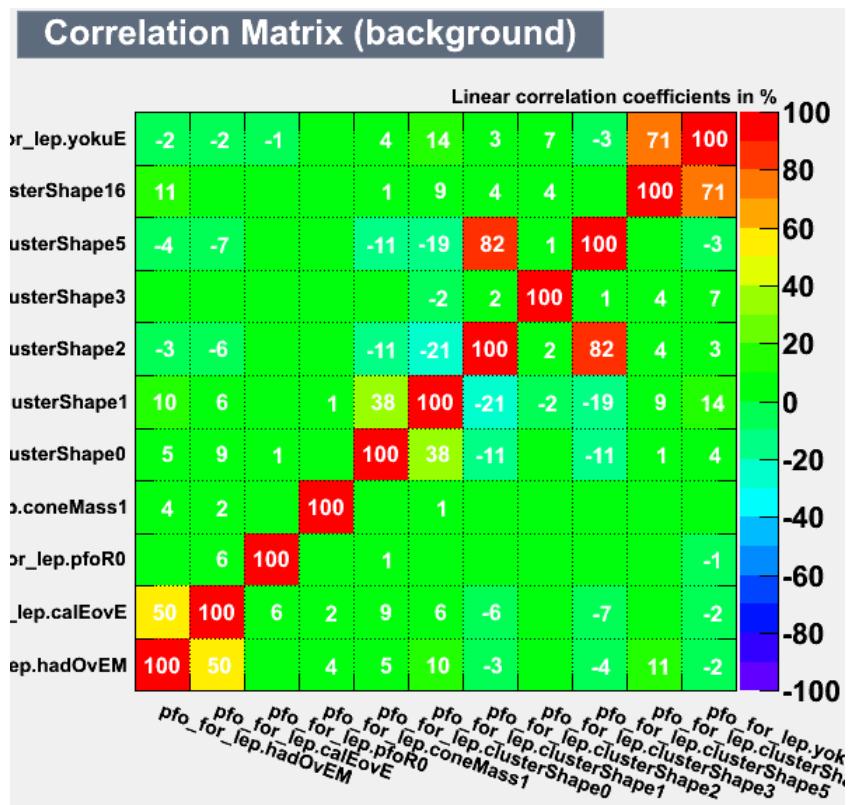
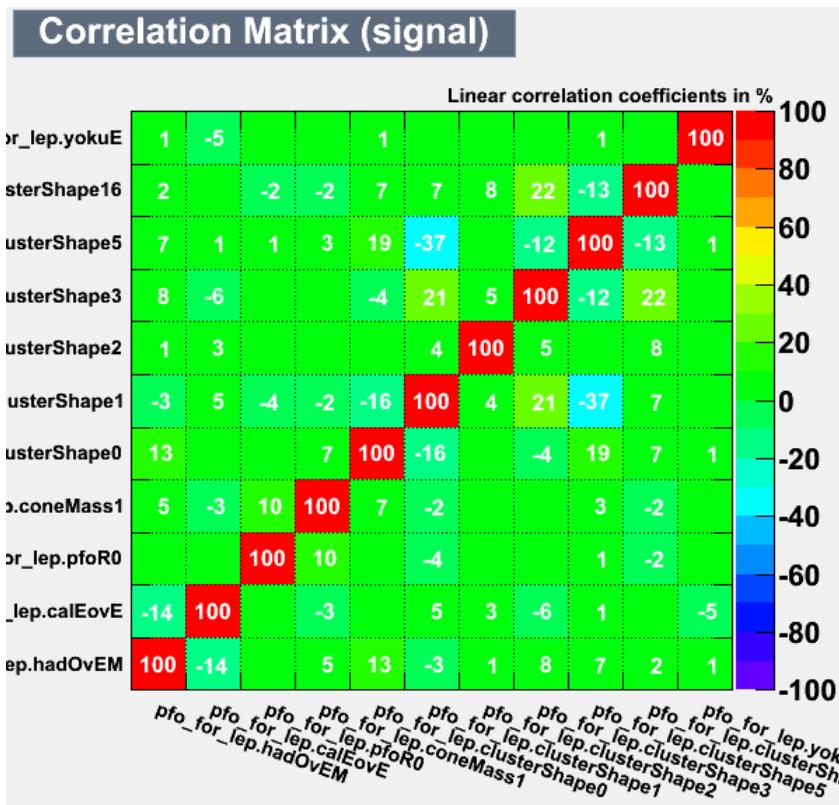
Input variables and Linear correlation matrix

- input variables are chosen to maximize area of ROC curve

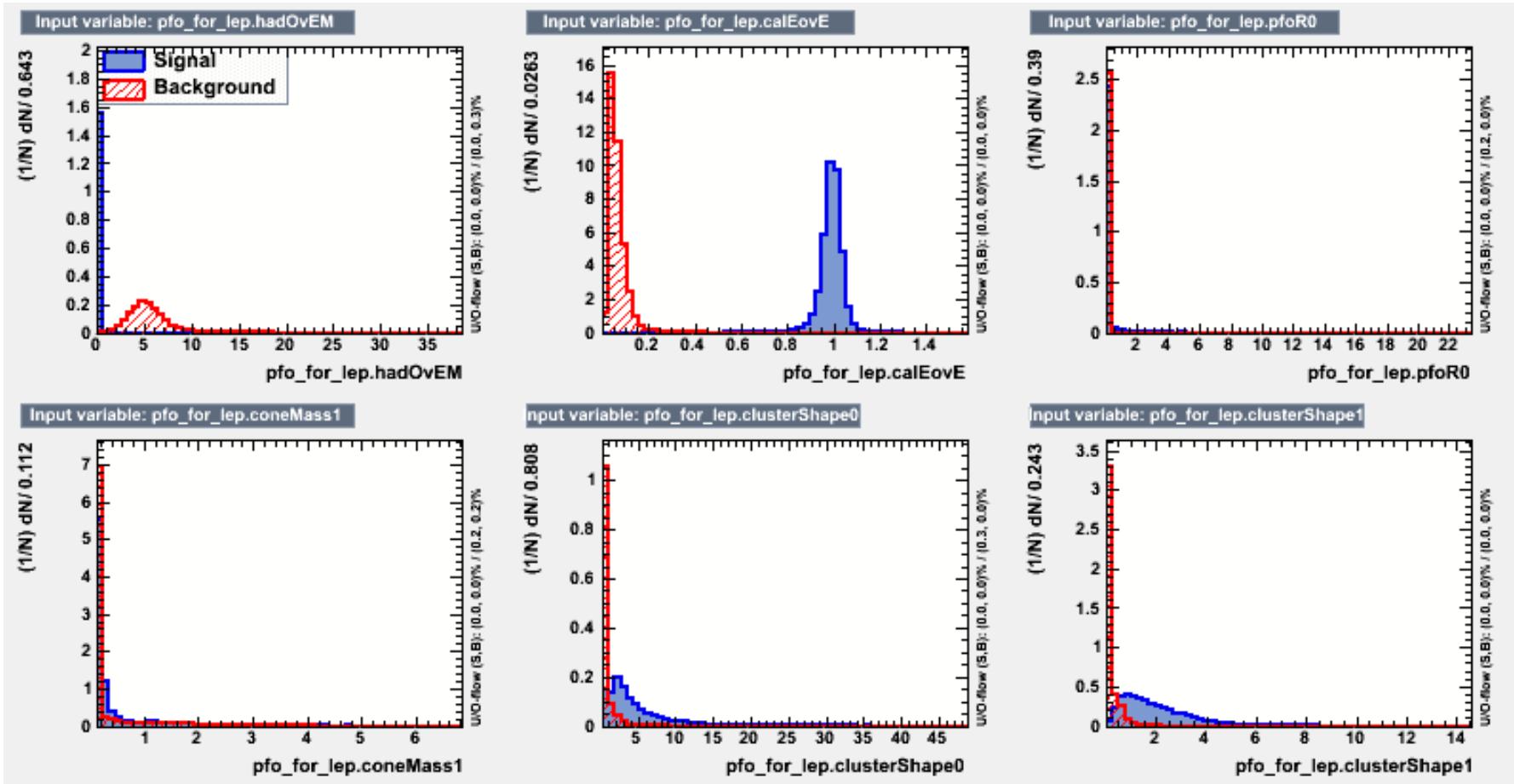
Correlation plots

electron

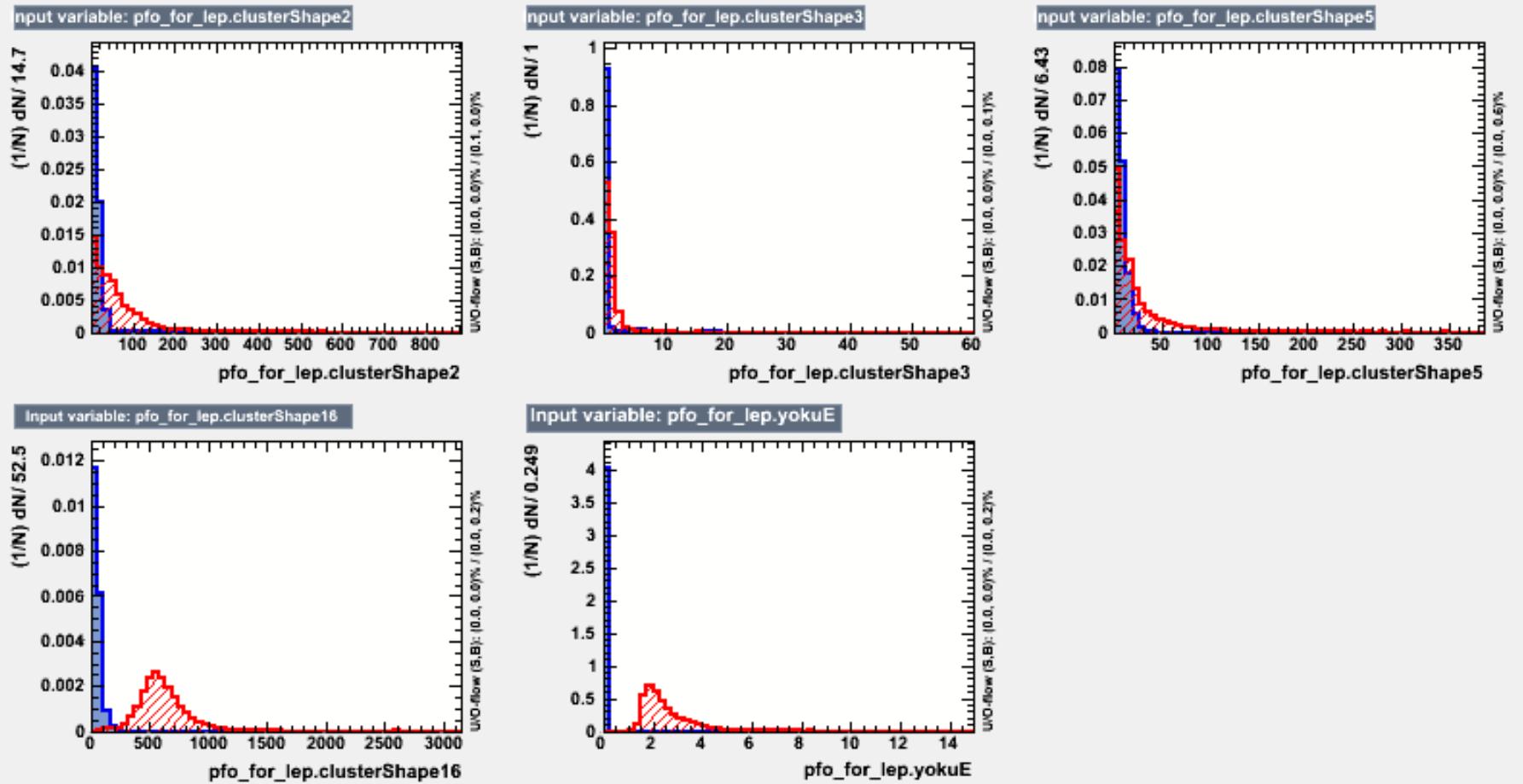
muon



BDT input variables e-mu 1

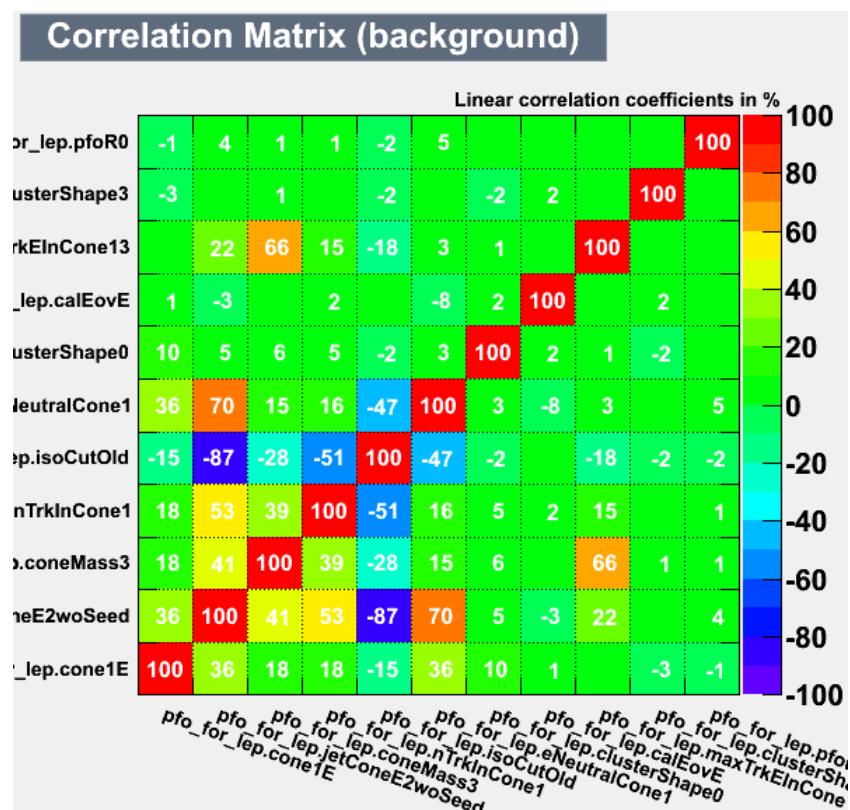
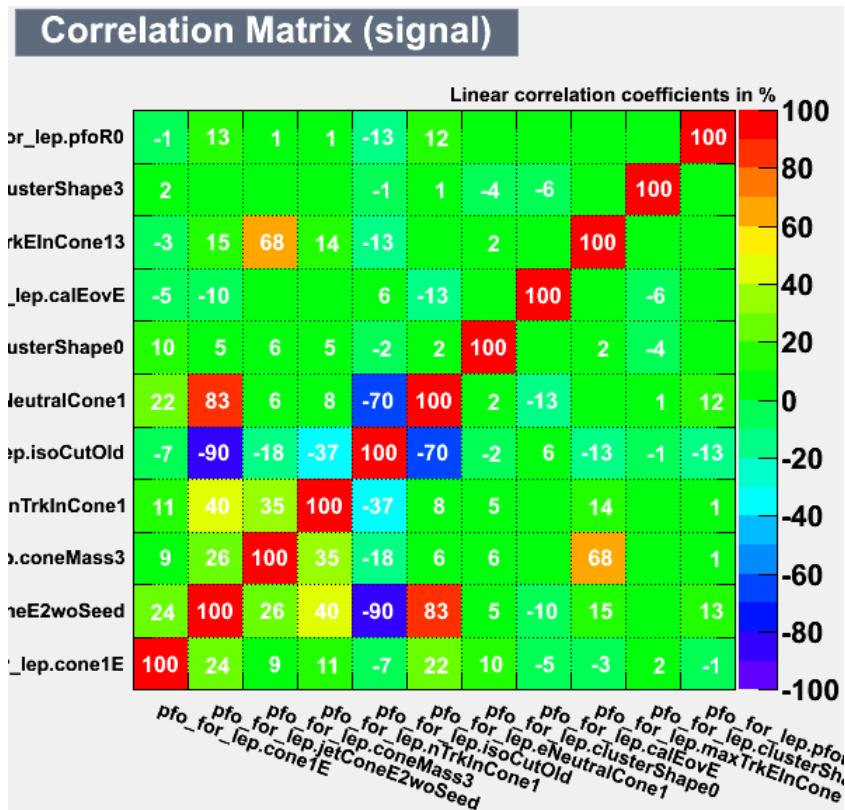


BDT input variables e-mu 2

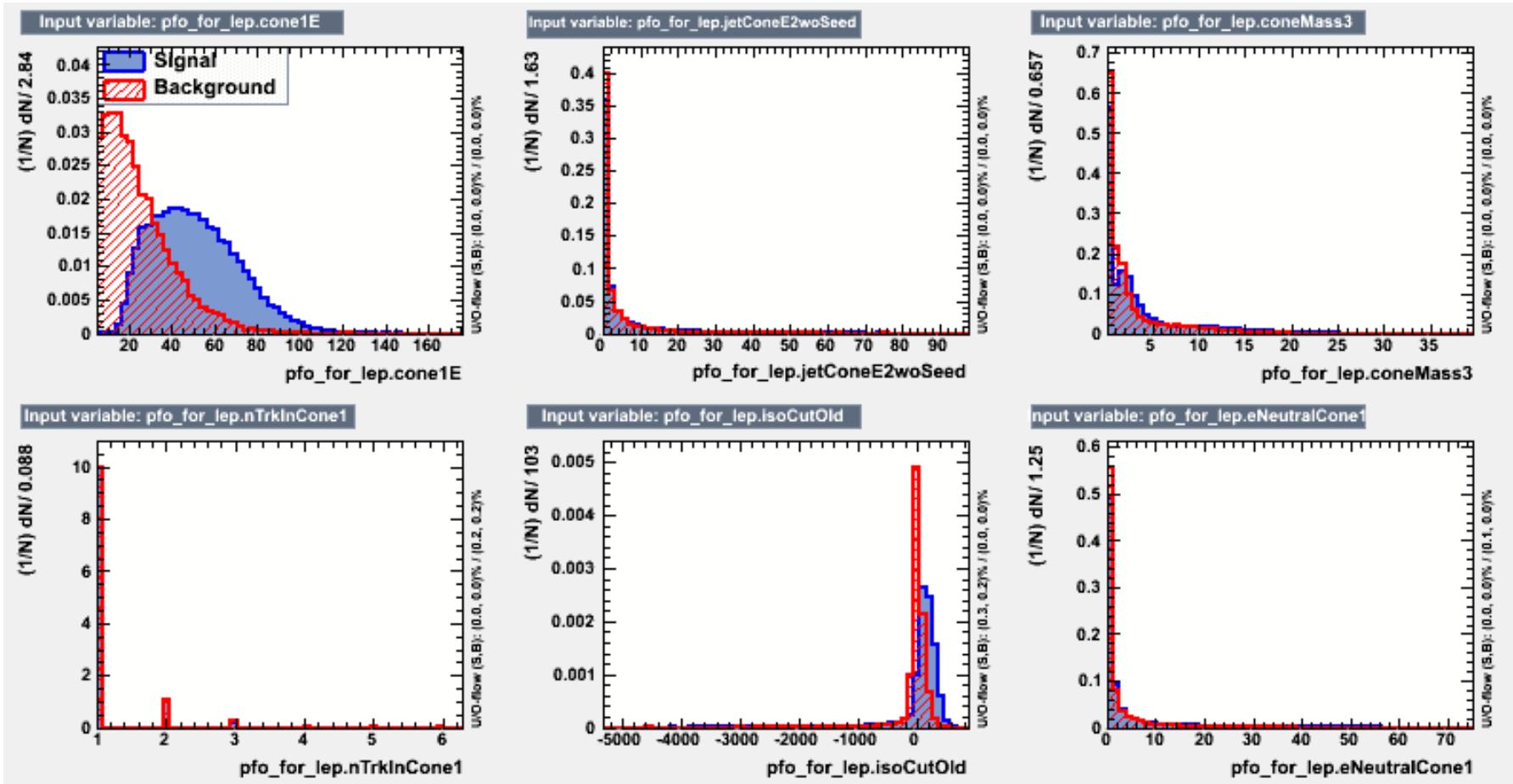


Correlation

electron

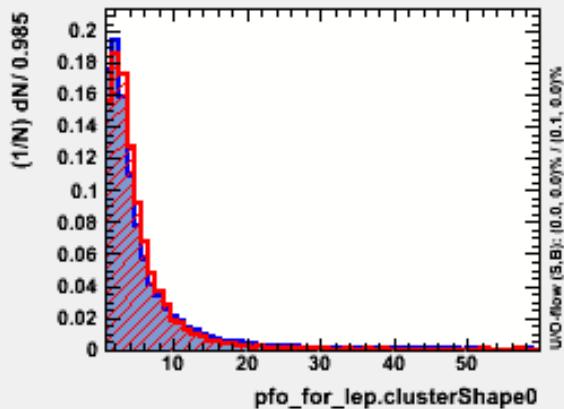


BDT input variables e-tau e 1

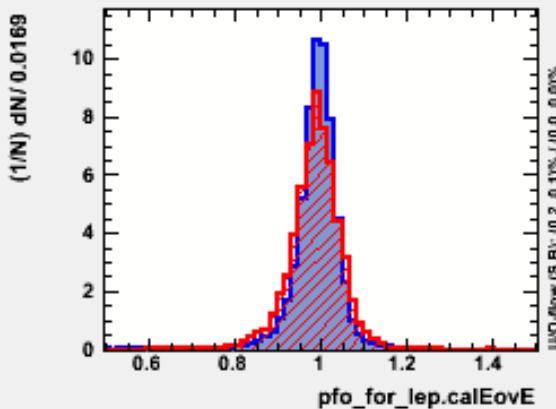


BDT input variables e-taue 2

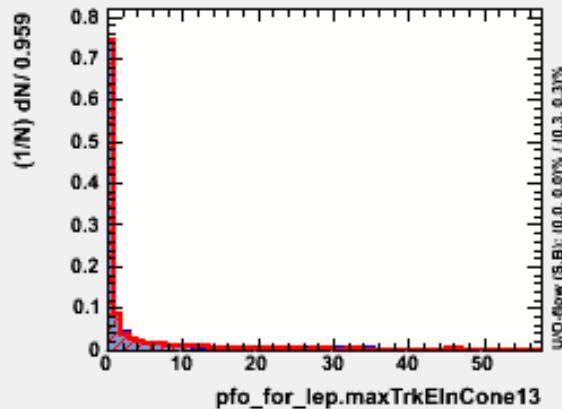
Input variable: pfo_for_lep.clusterShape0



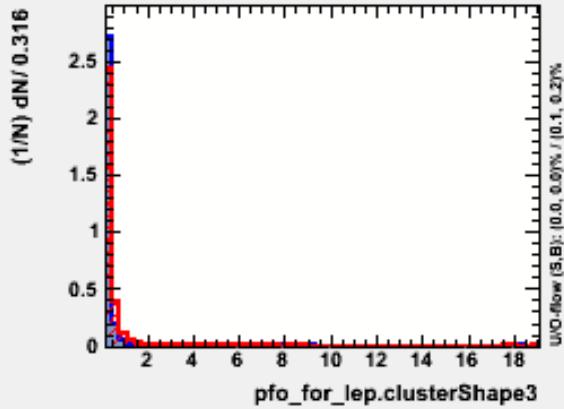
Input variable: pfo_for_lep.calEovE



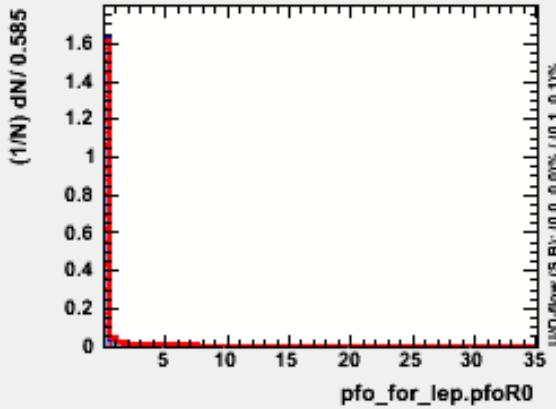
Input variable: pfo_for_lep.maxTrkEInCone13



Input variable: pfo_for_lep.clusterShape3

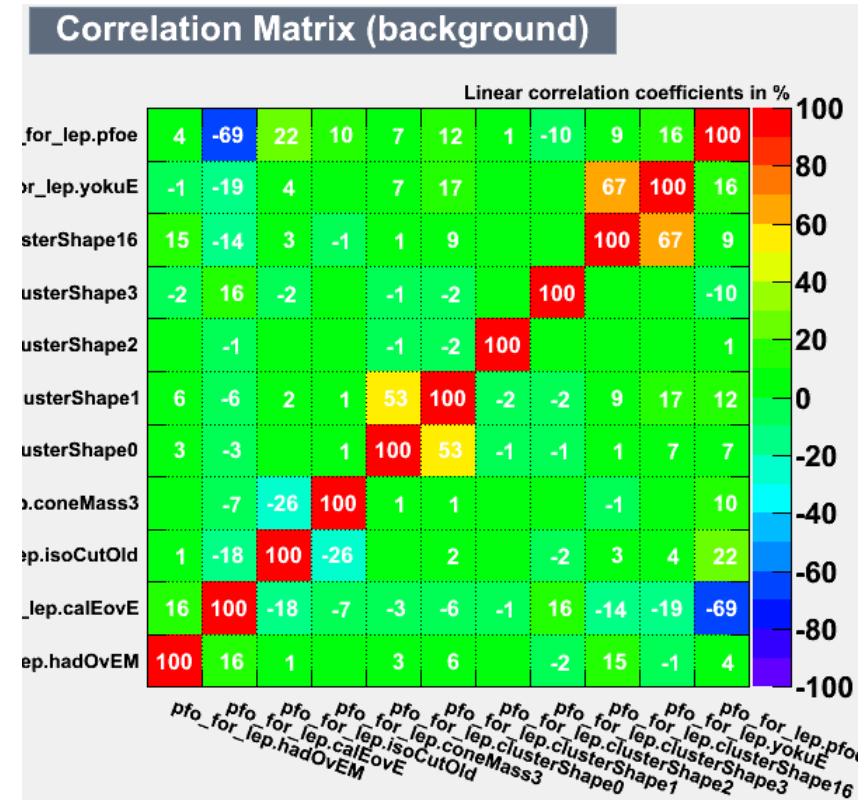
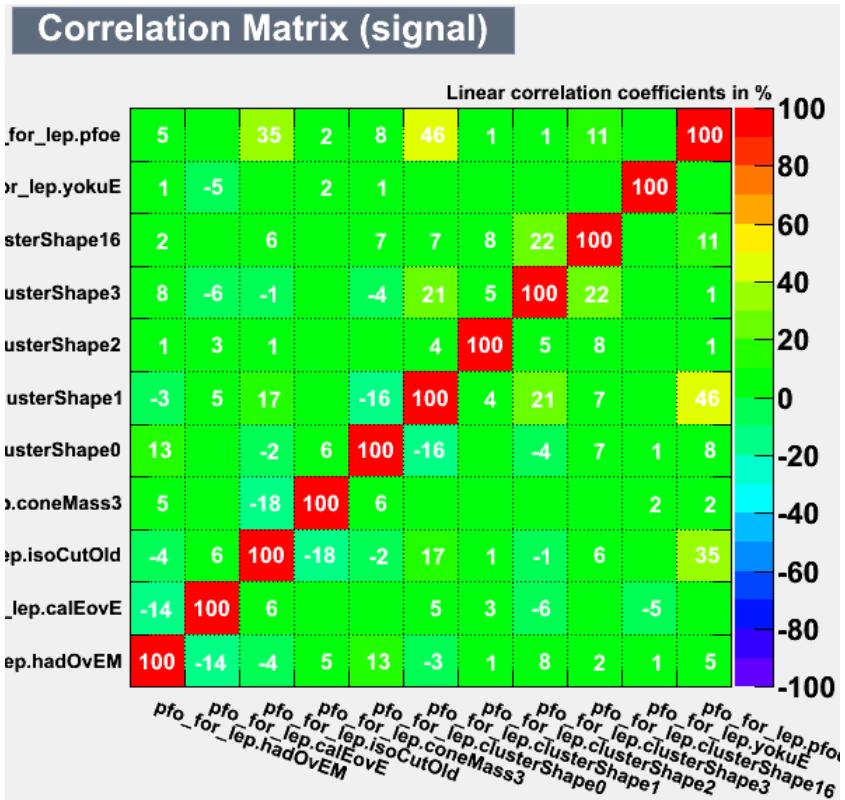


Input variable: pfo_for_lep.pfoR0

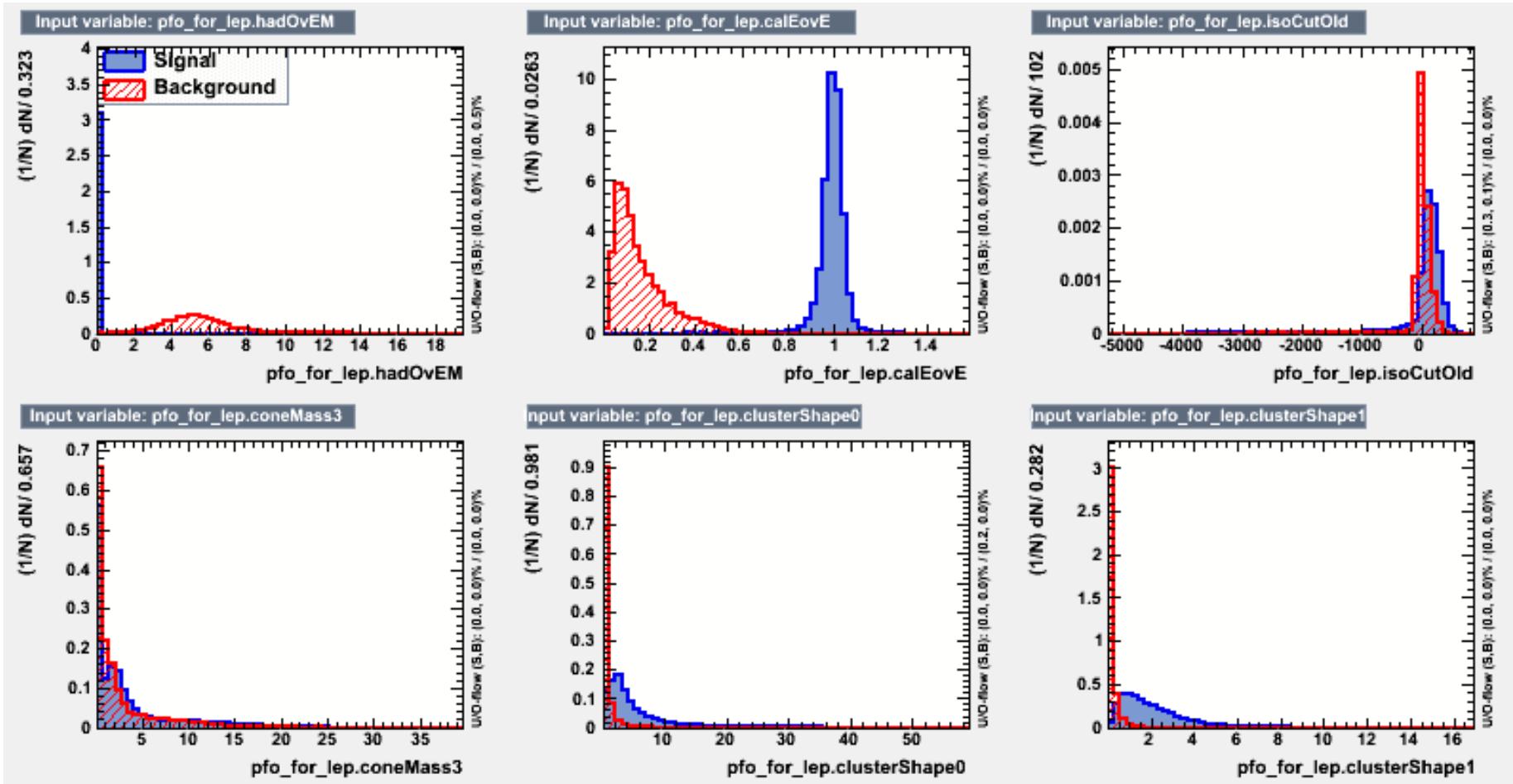


Correlation

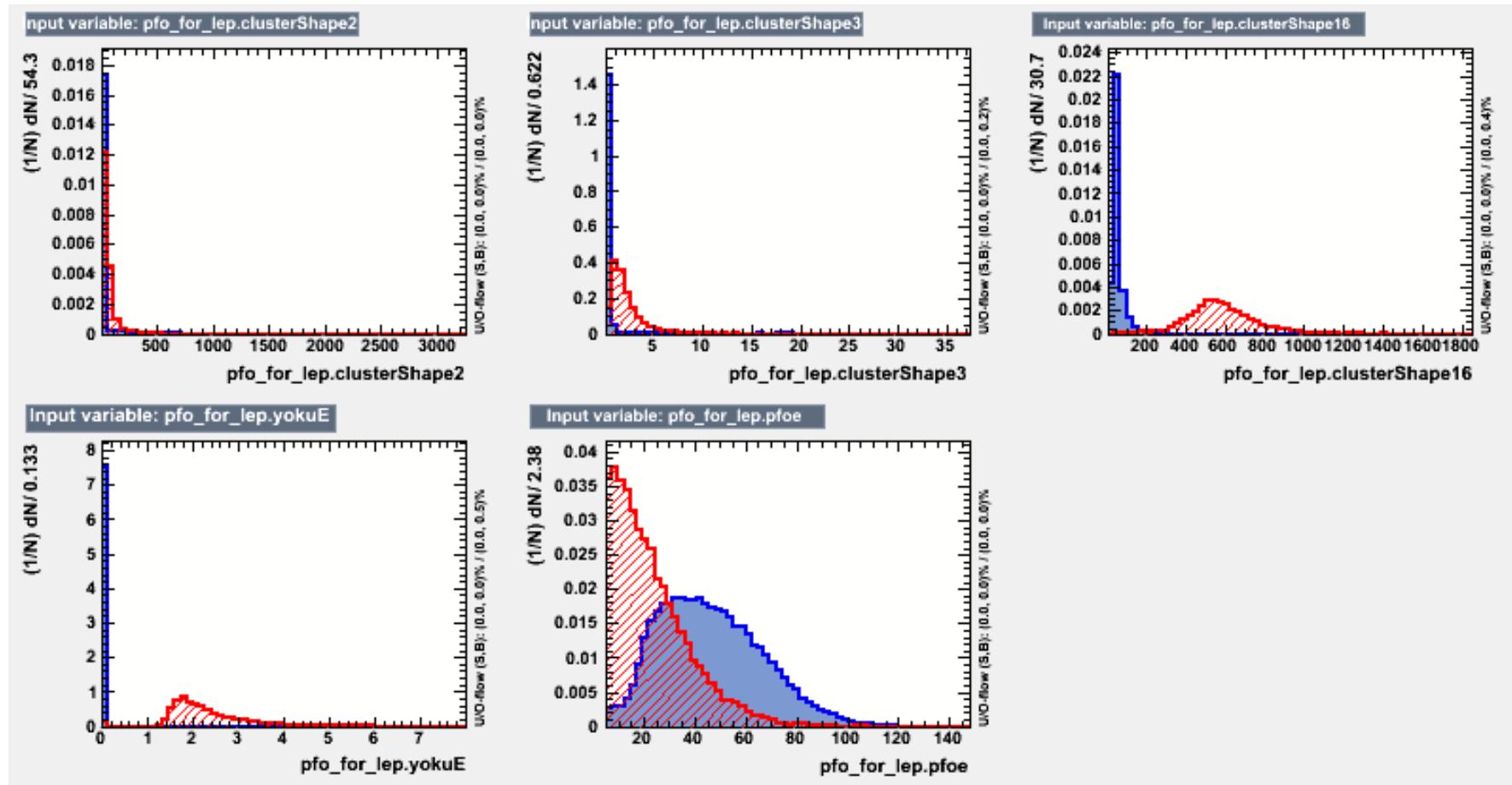
electron



BDT input variables e-taum 1



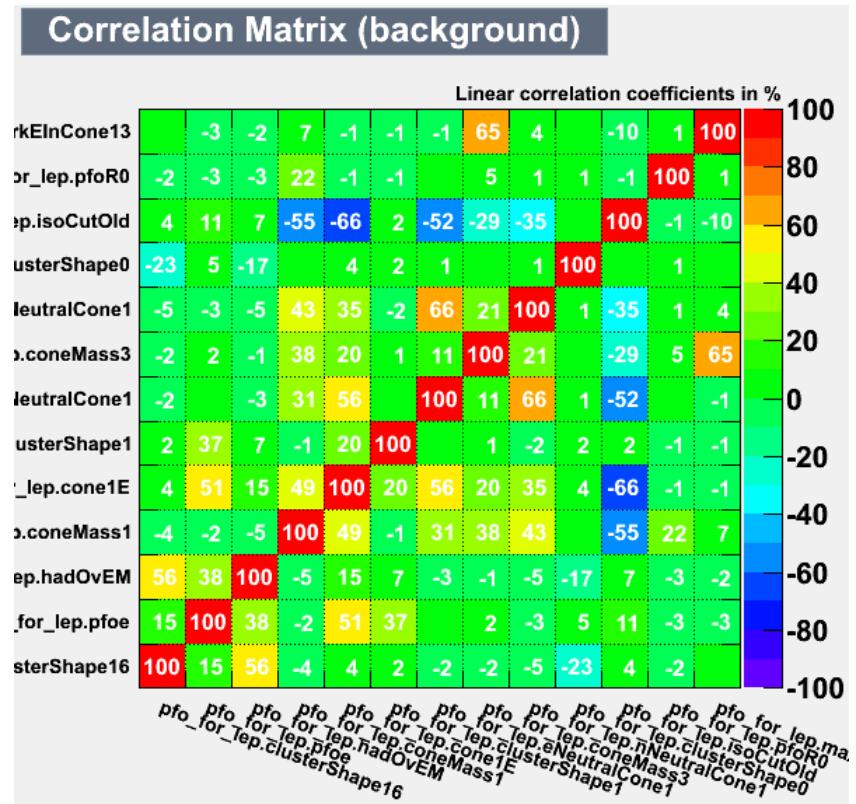
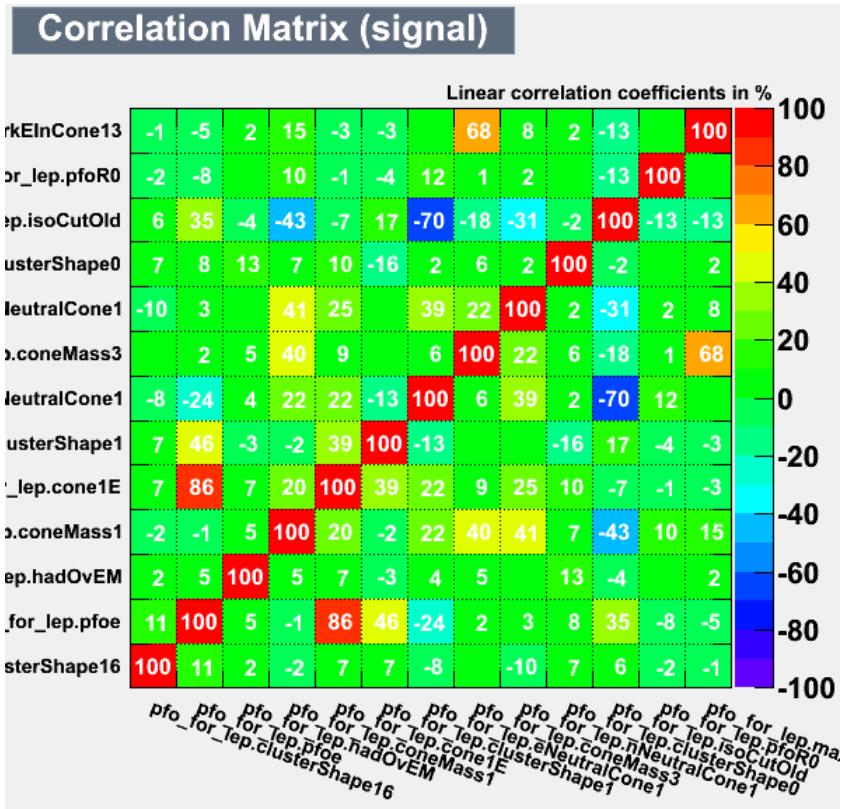
BDT input variables e-taum 2



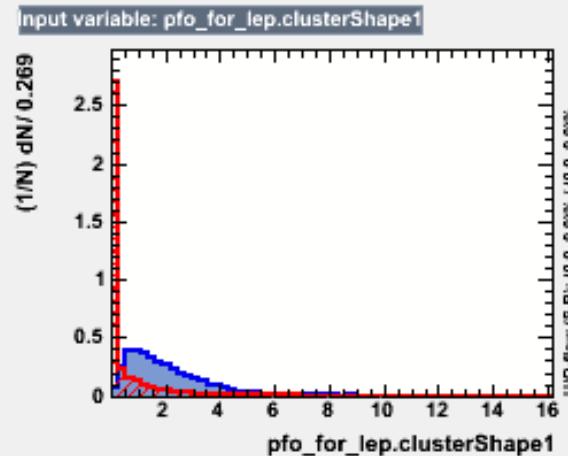
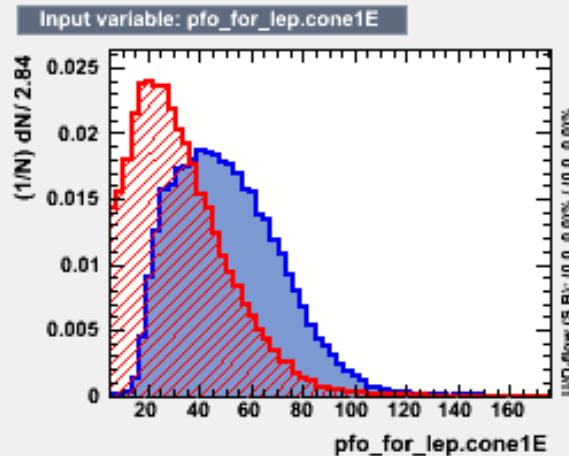
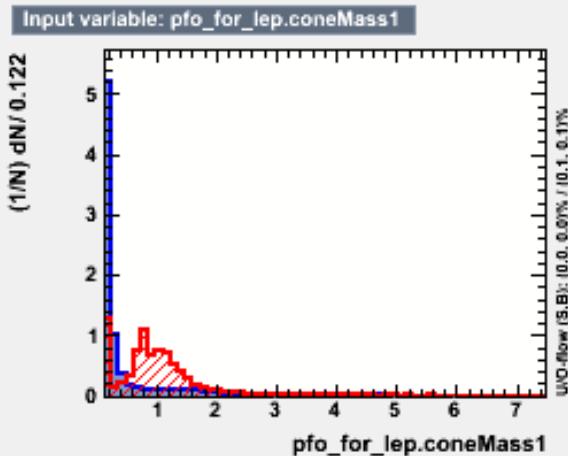
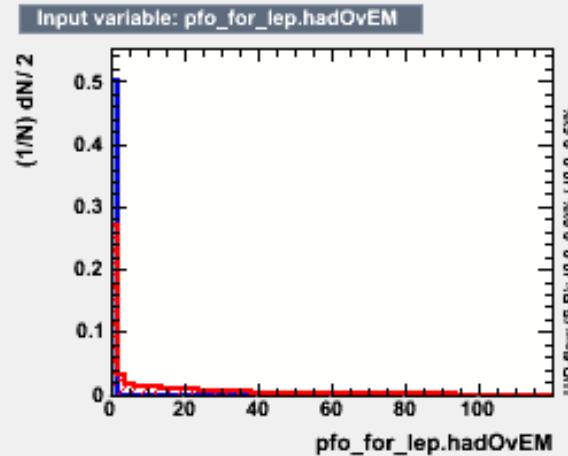
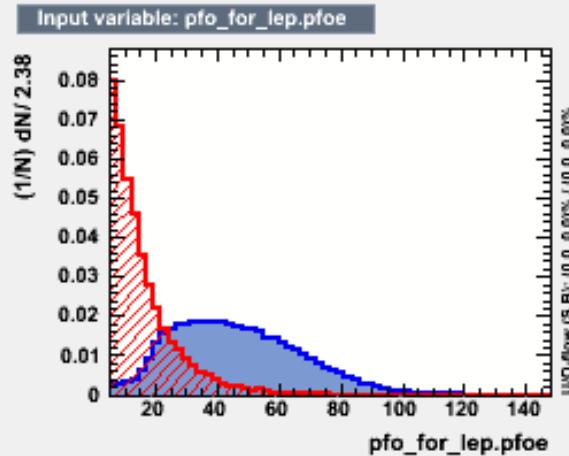
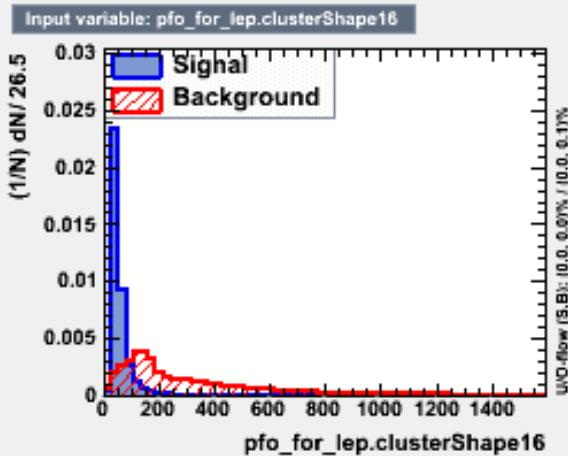
Correlation

electron

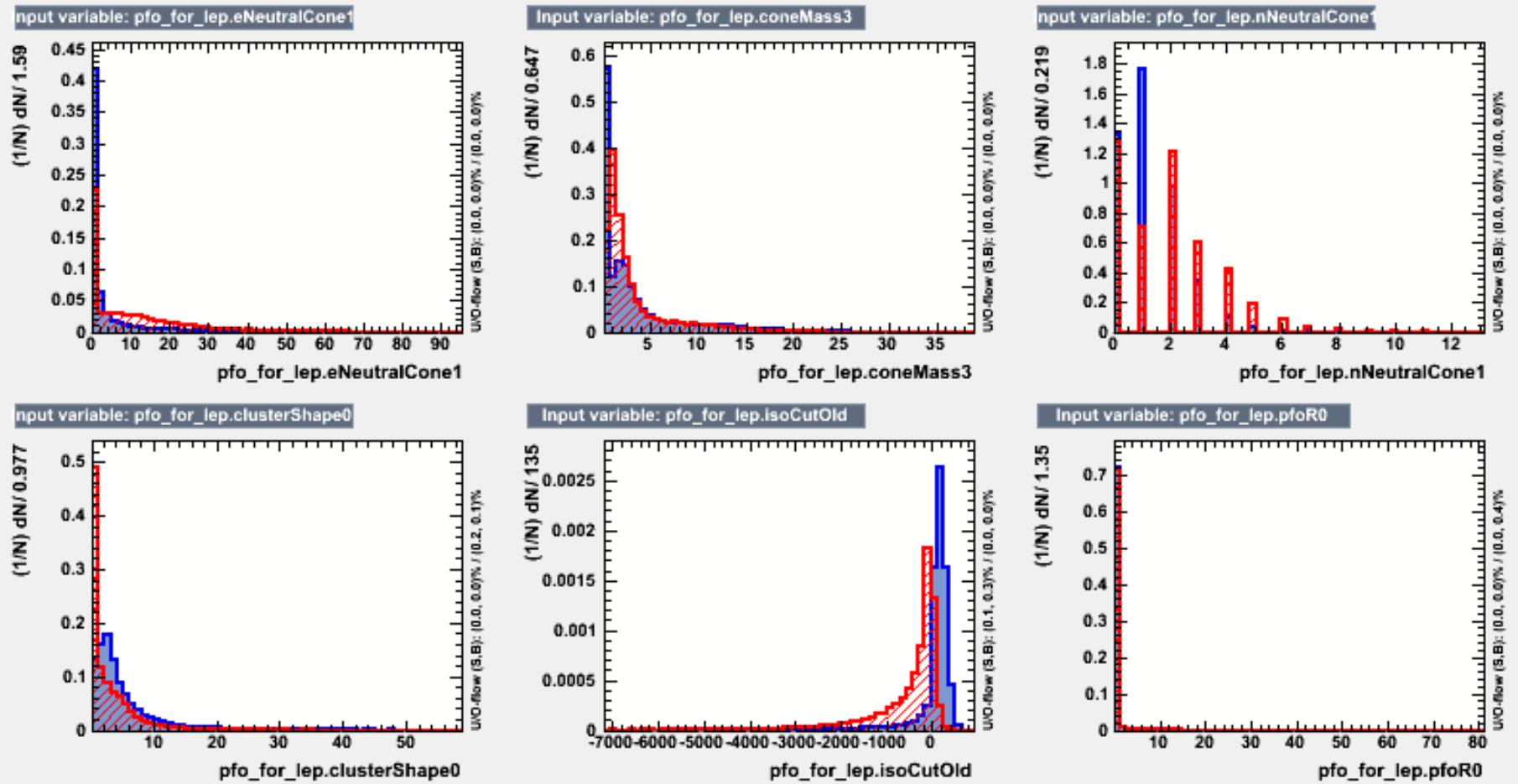
tau(h)



BDT input variables e-tauh 1

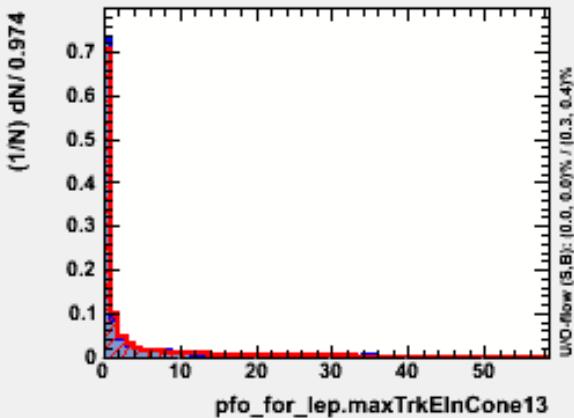


BDT input variables e-tauh 2



BDT input variables e-tauh 3

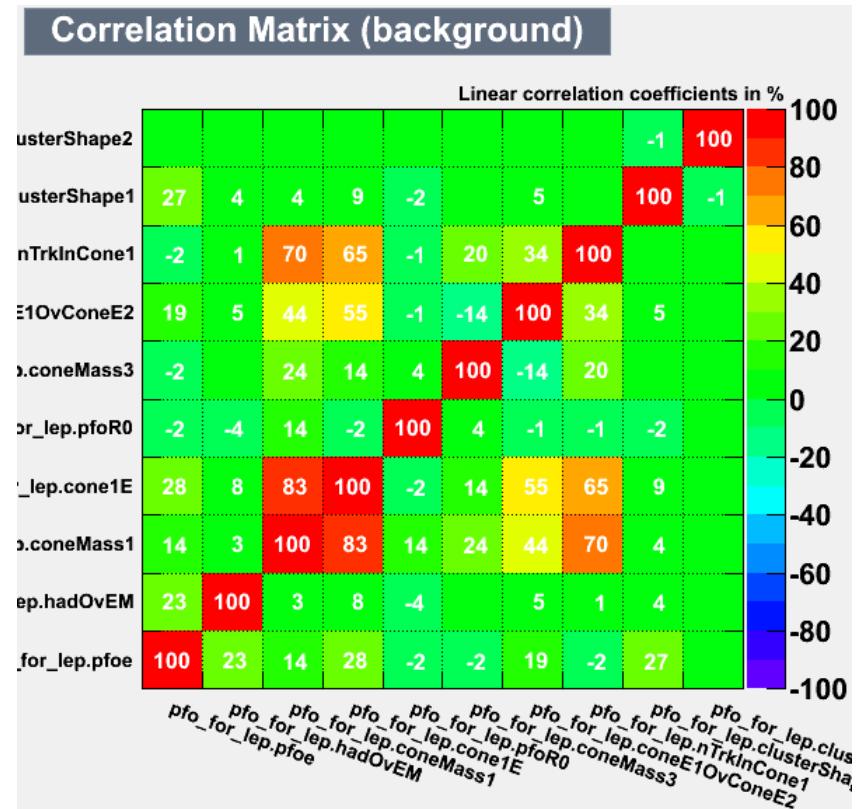
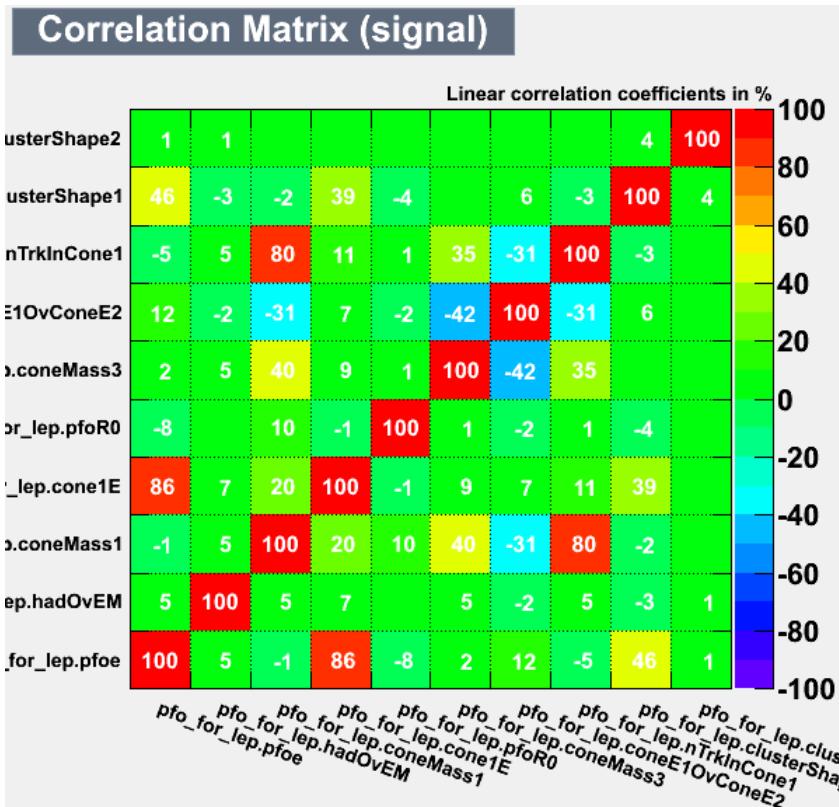
Input variable: pfo_for_lep.maxTrkElInCone13



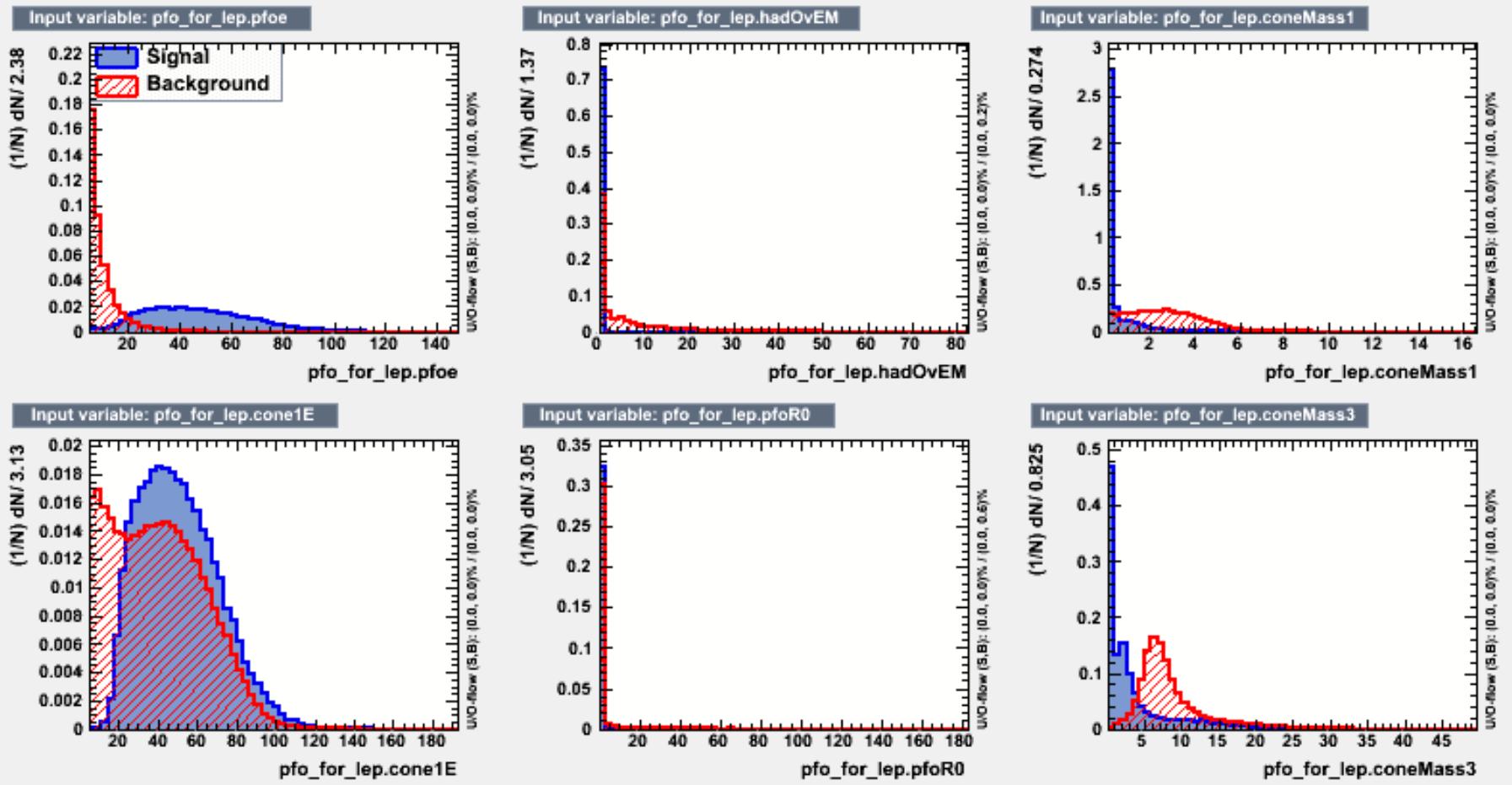
Correlation

electron

b jet

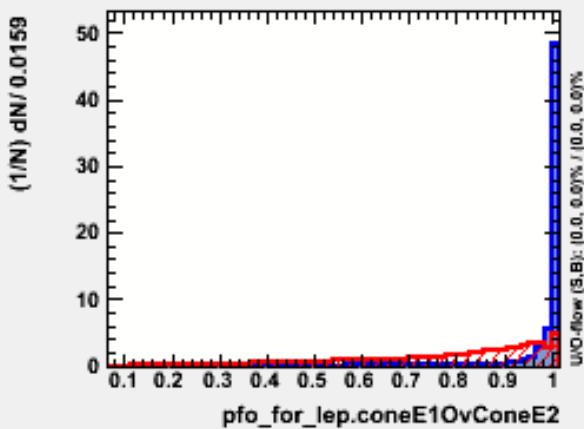


BDT input variables e-bjet 1

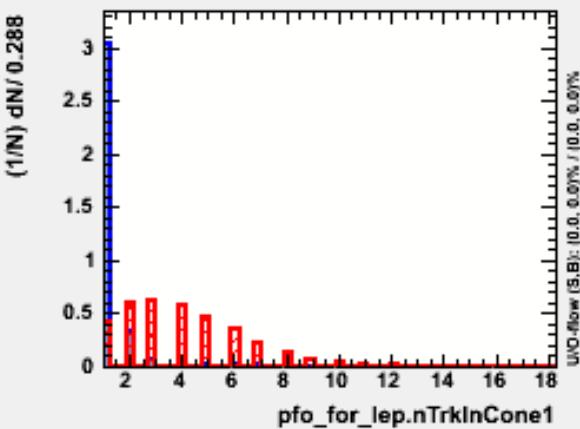


BDT input variables e-bjet 2

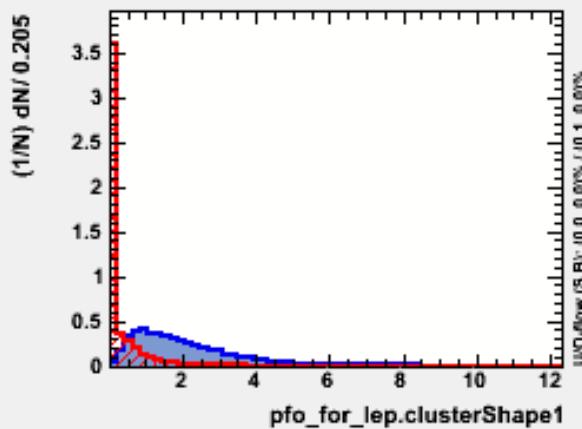
Input variable: pfo_for_lep.coneE1OverConeE2



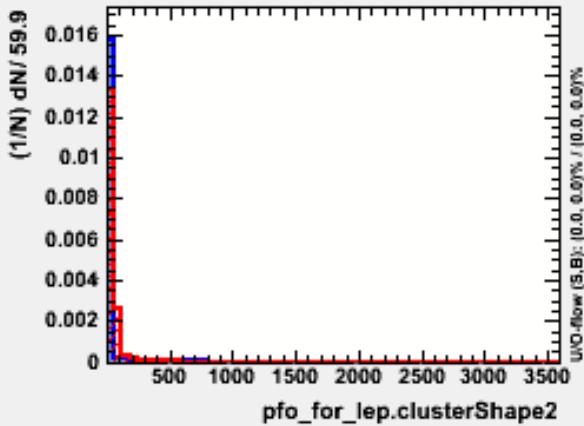
Input variable: pfo_for_lep.nTrkInCone1



Input variable: pfo_for_lep.clusterShape1



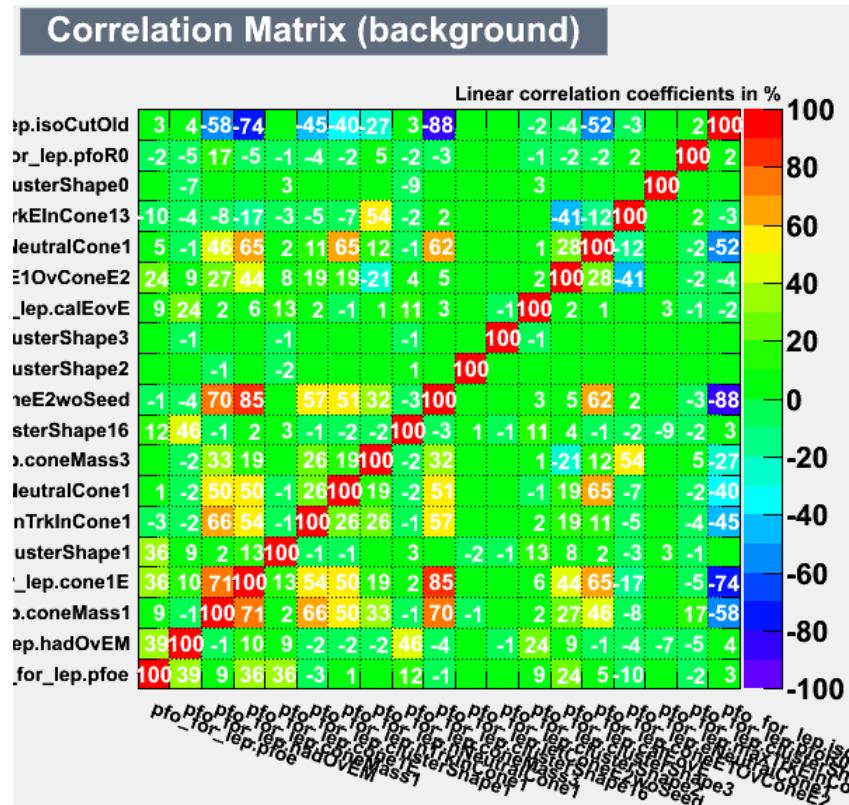
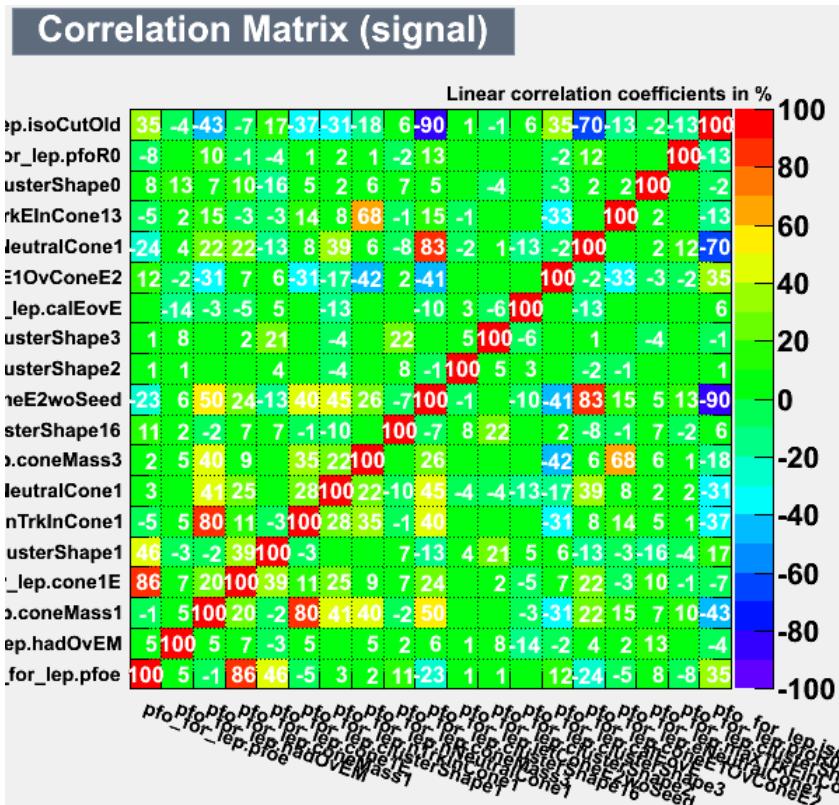
Input variable: pfo_for_lep.clusterShape2



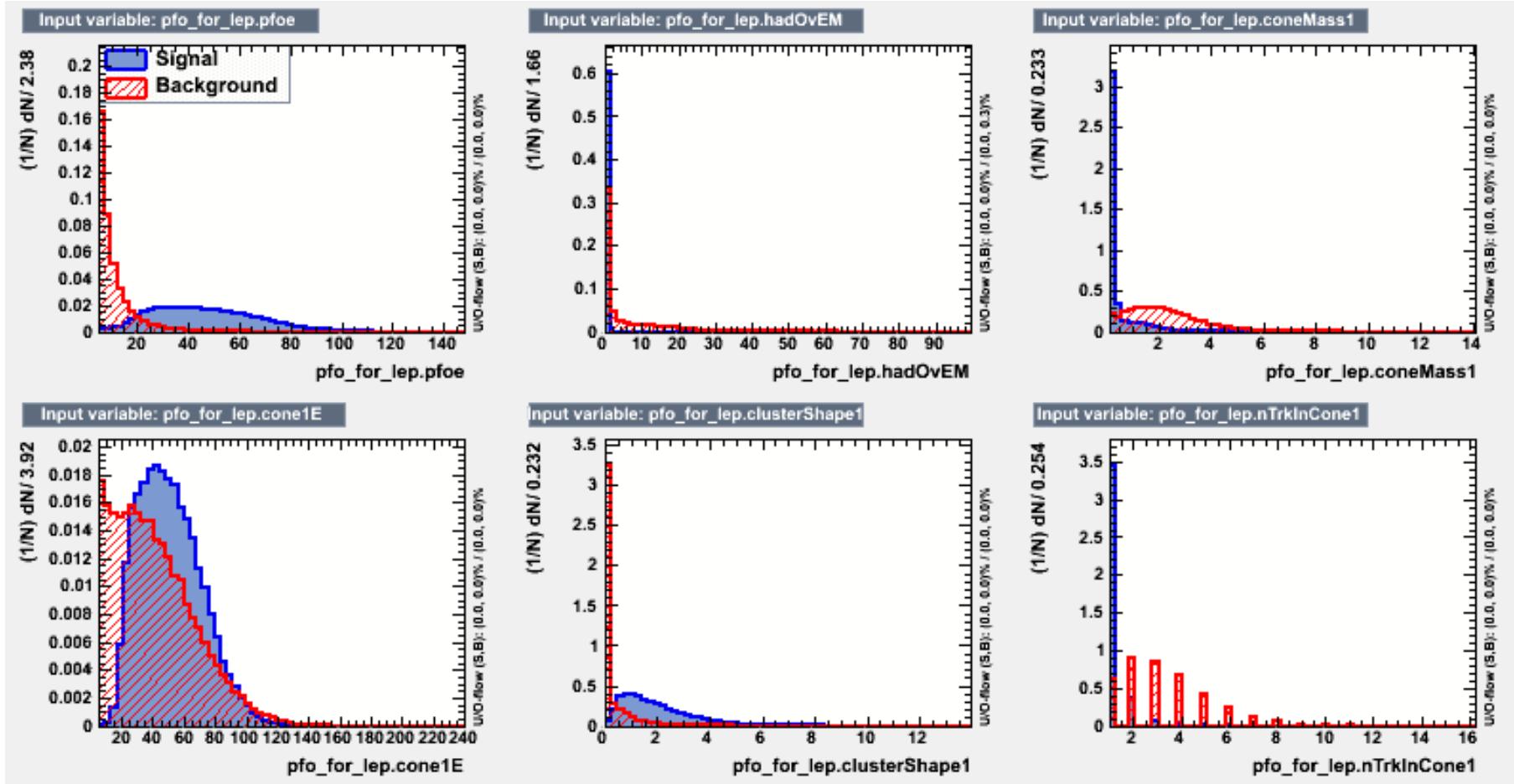
Correlation

electron

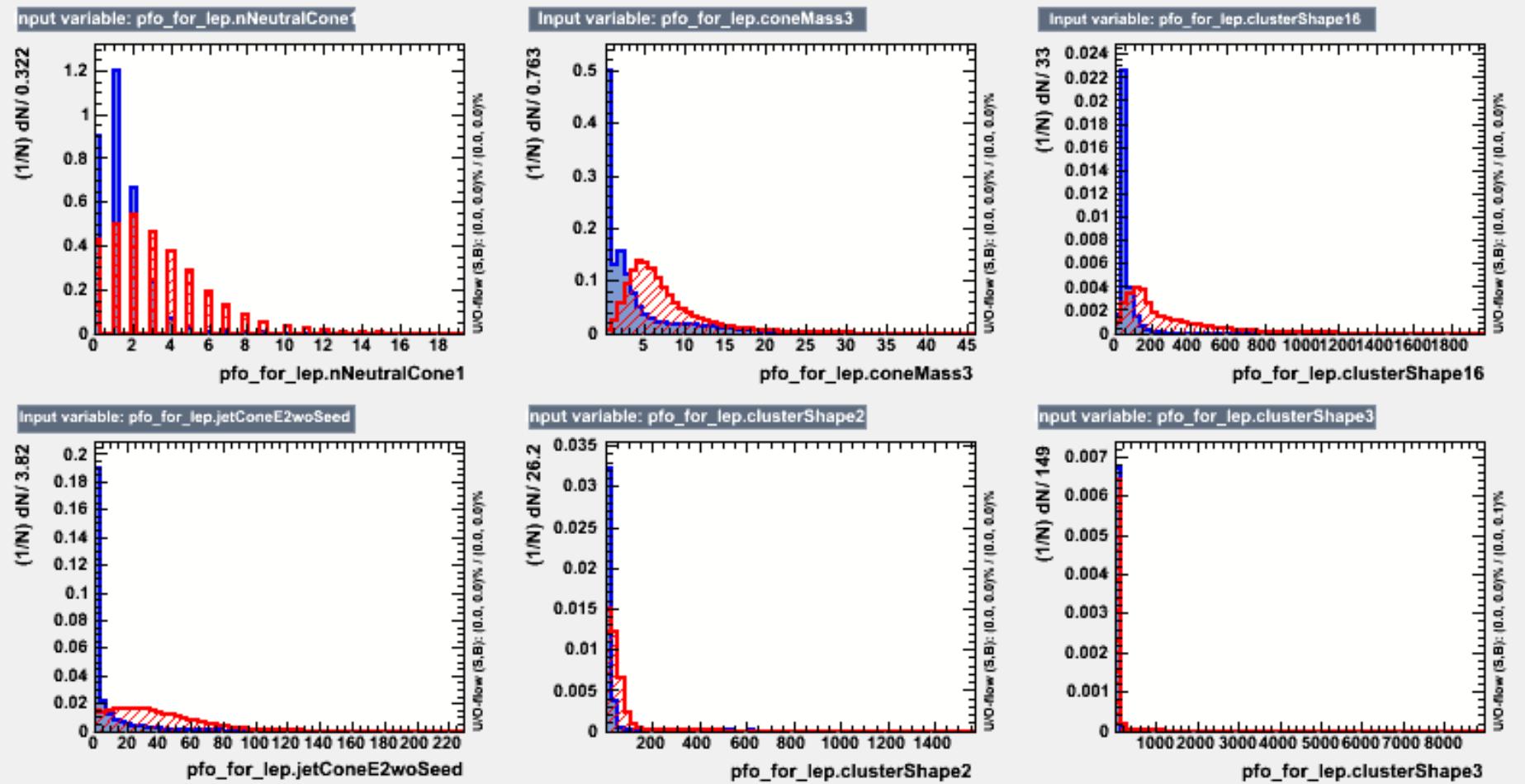
If jet



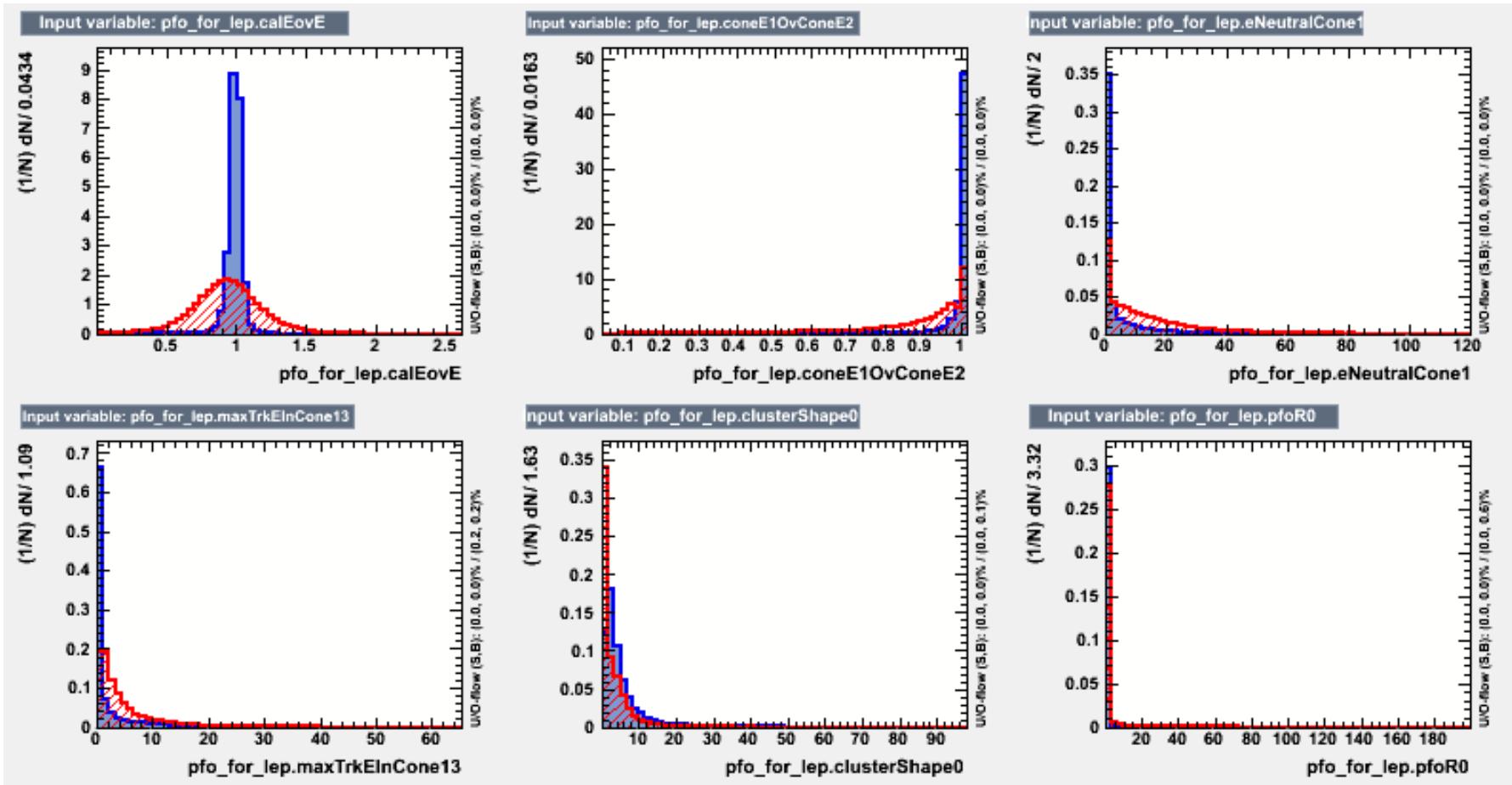
BDT input variables e-1fjet 1



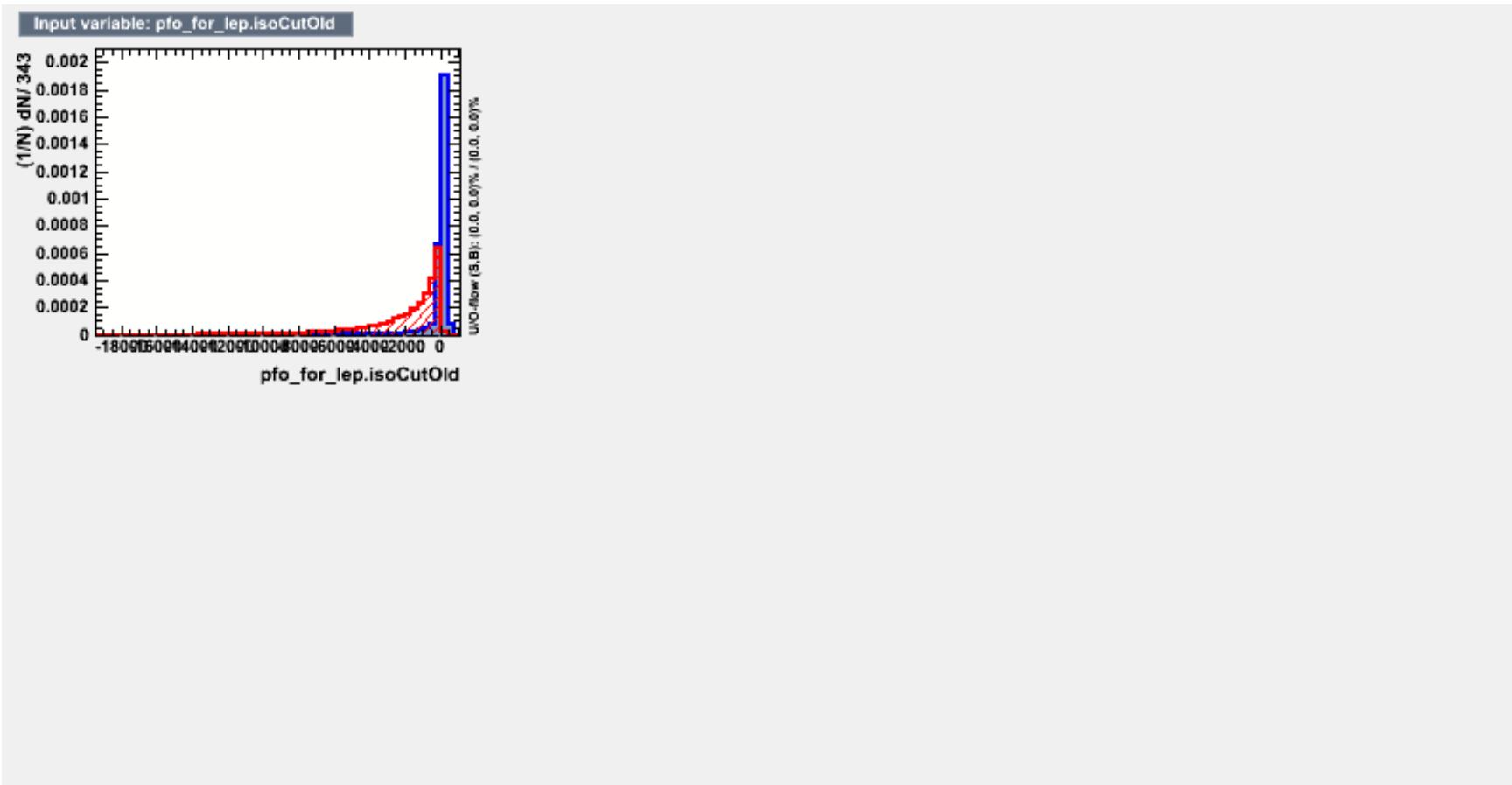
BDT input variables e-|fjet 2



BDT input variables e-|fjet 3



BDT input variables elfjet- 4

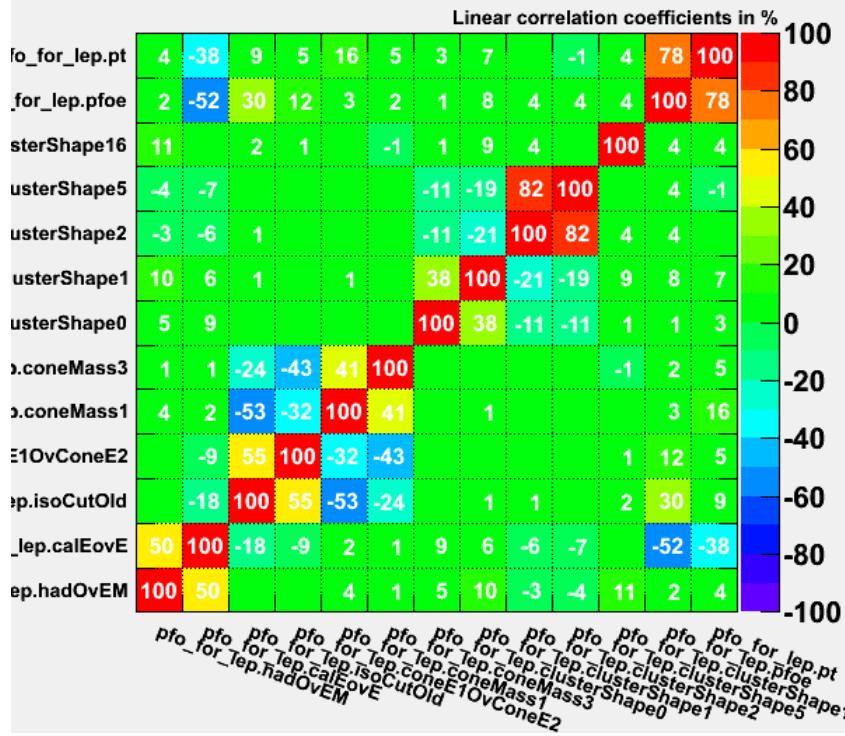


Correlation

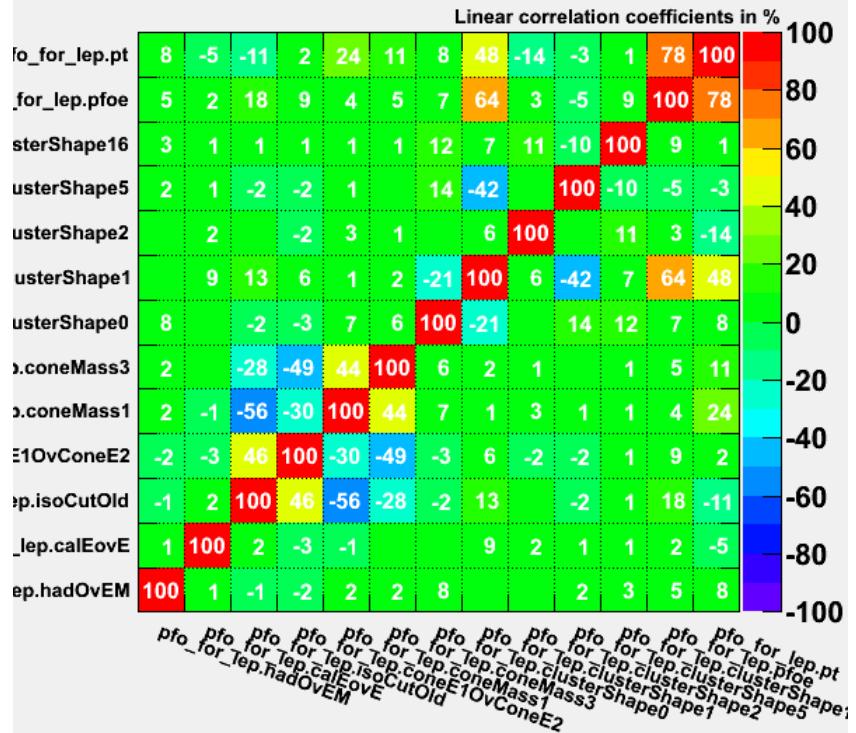
muon

tau(e)

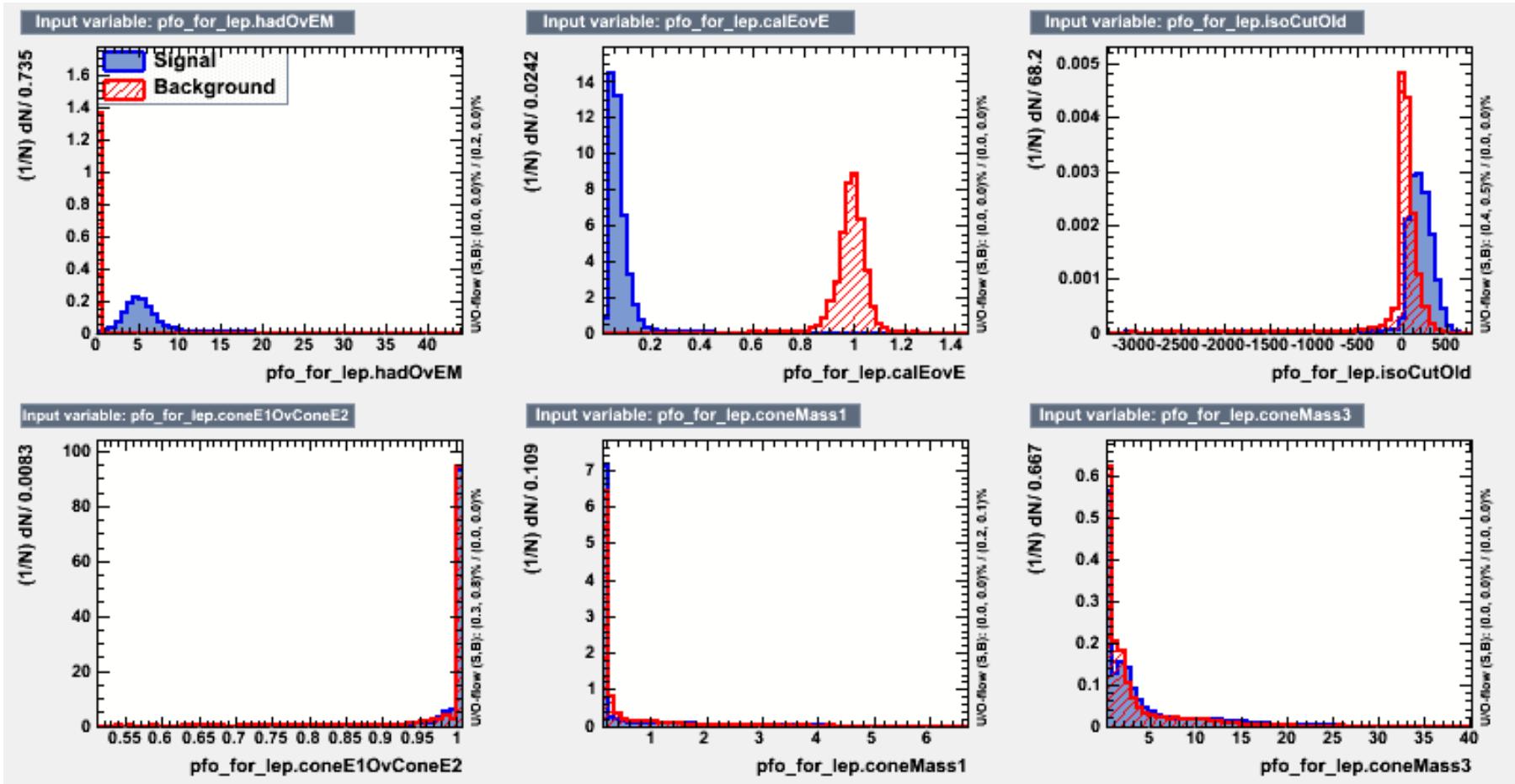
Correlation Matrix (signal)



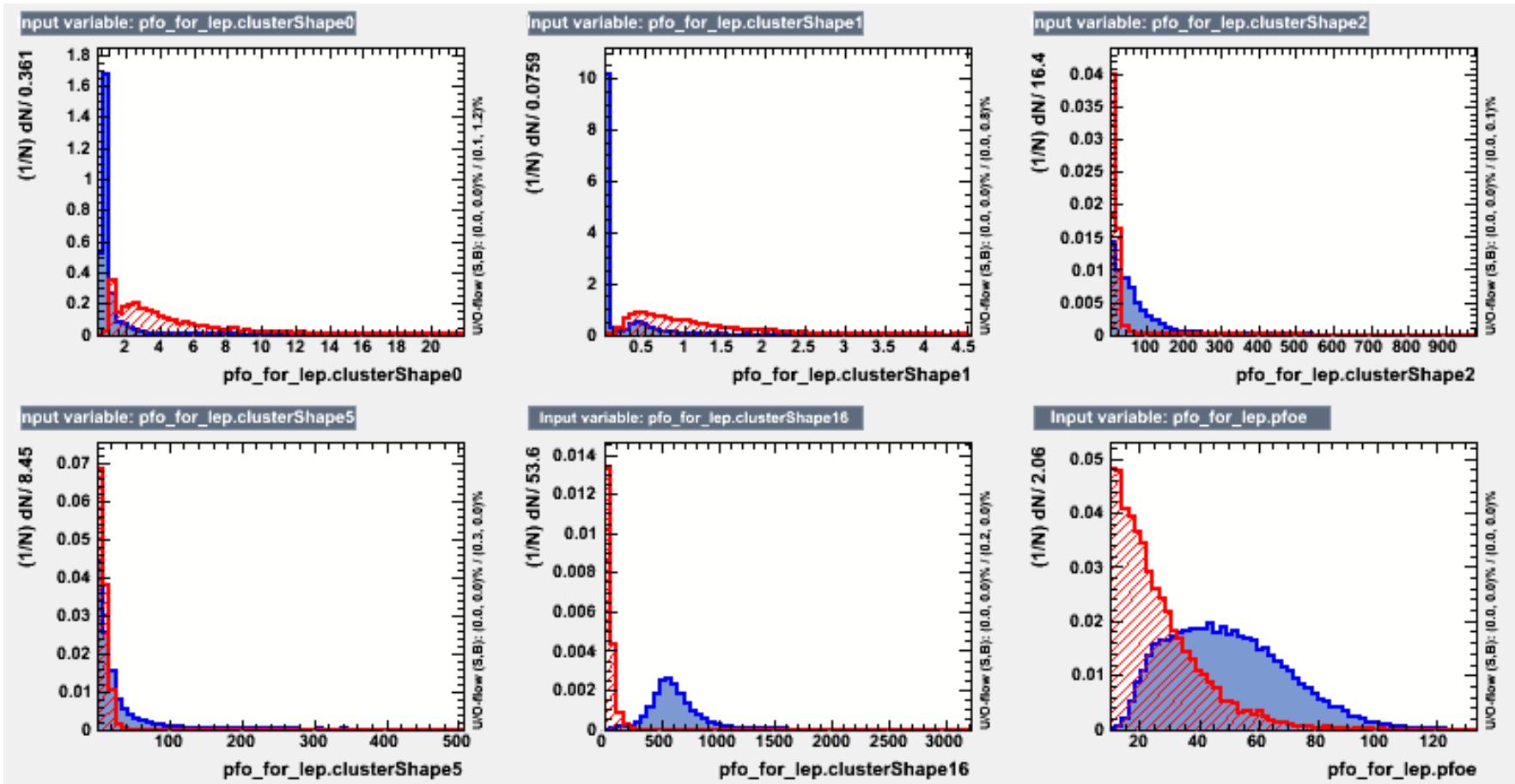
Correlation Matrix (background)



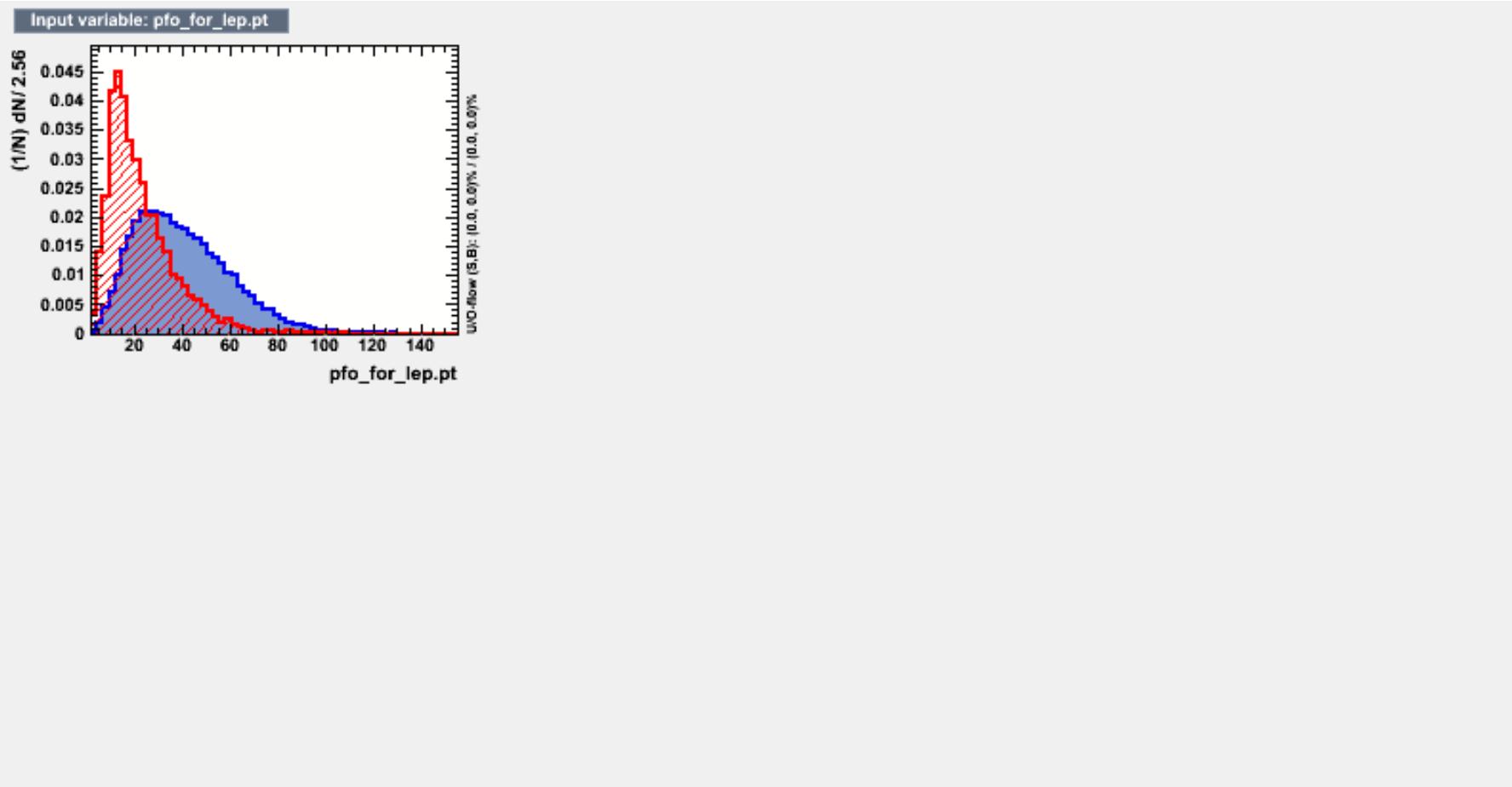
BDT input variables mu-taue 1



BDT input variables mu-taue 2

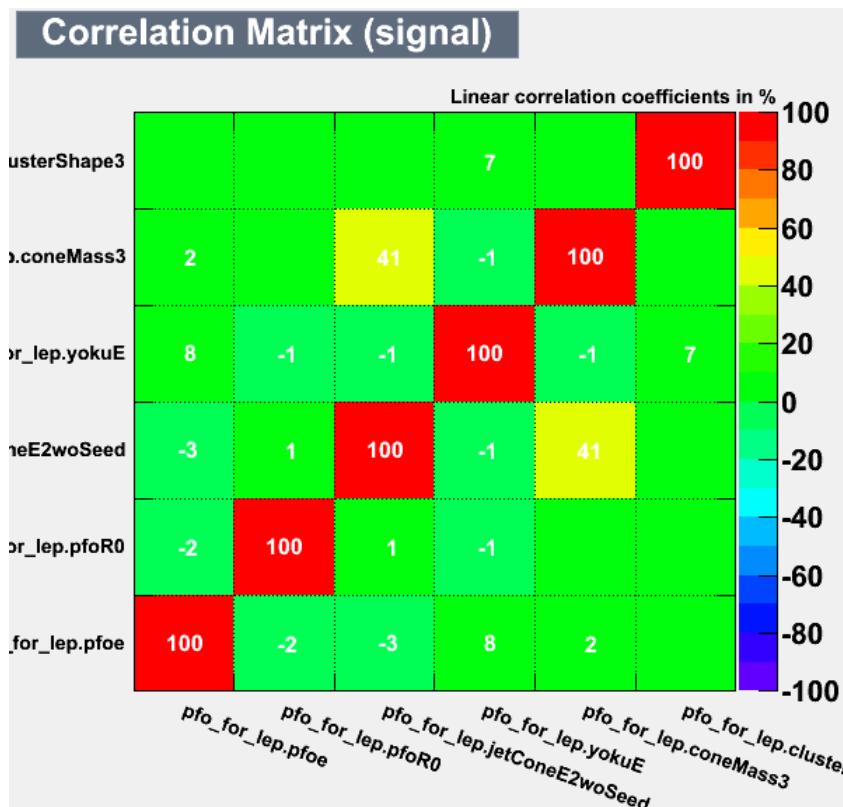


BDT input variables mu-taue 3

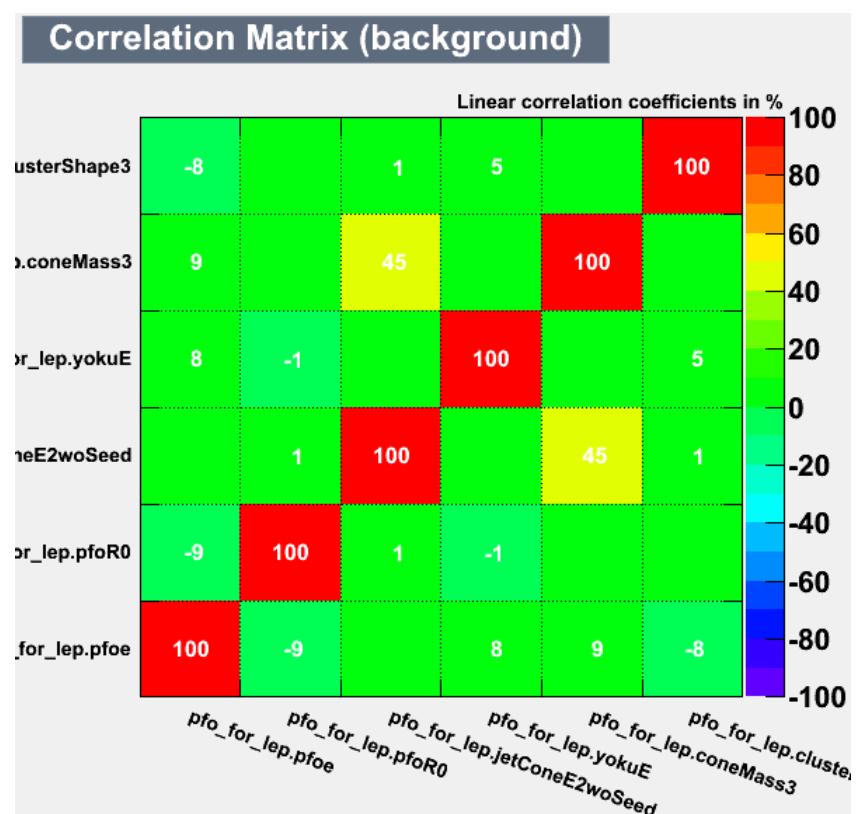


Correlation

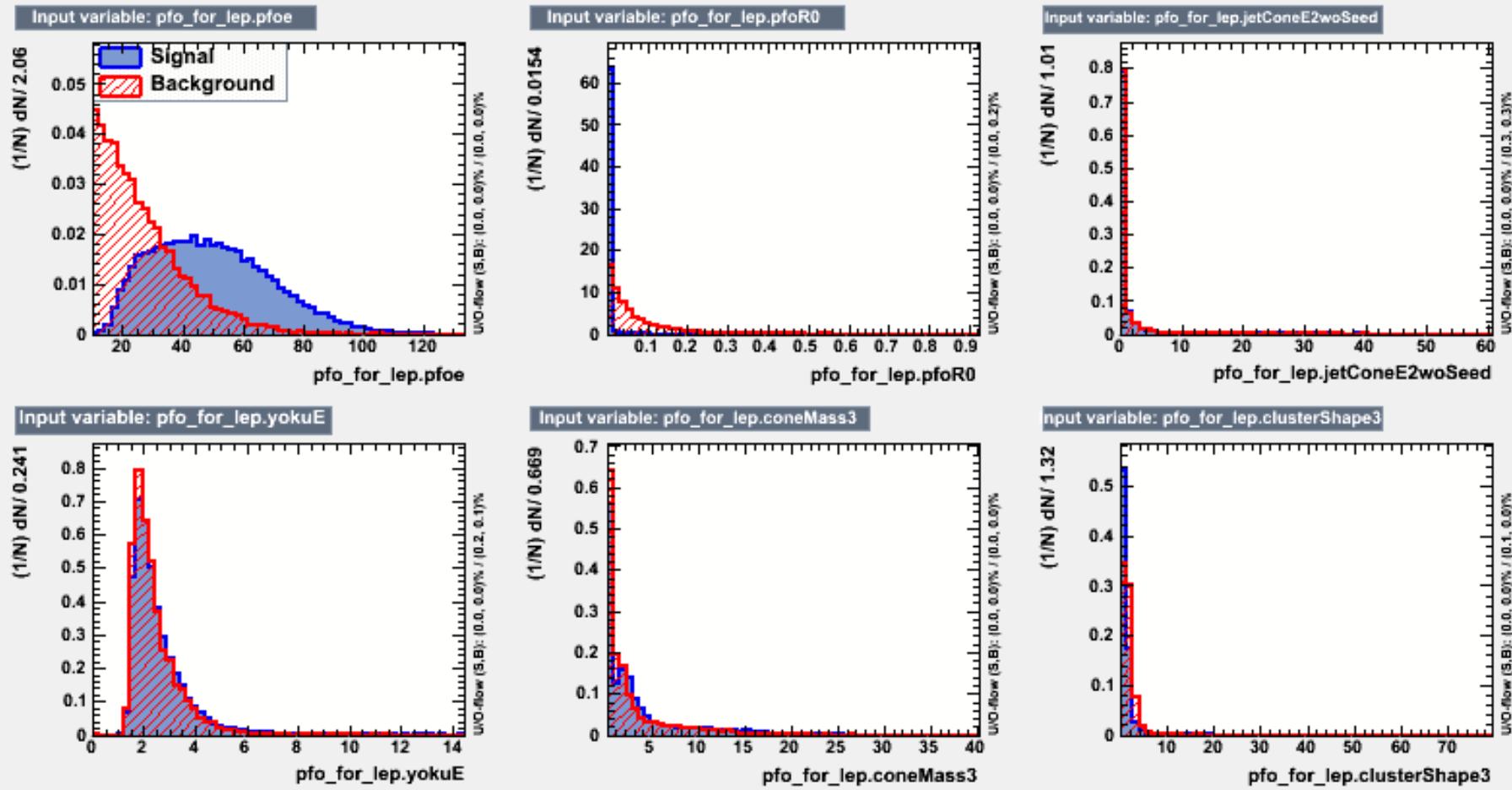
muon



tau(m)



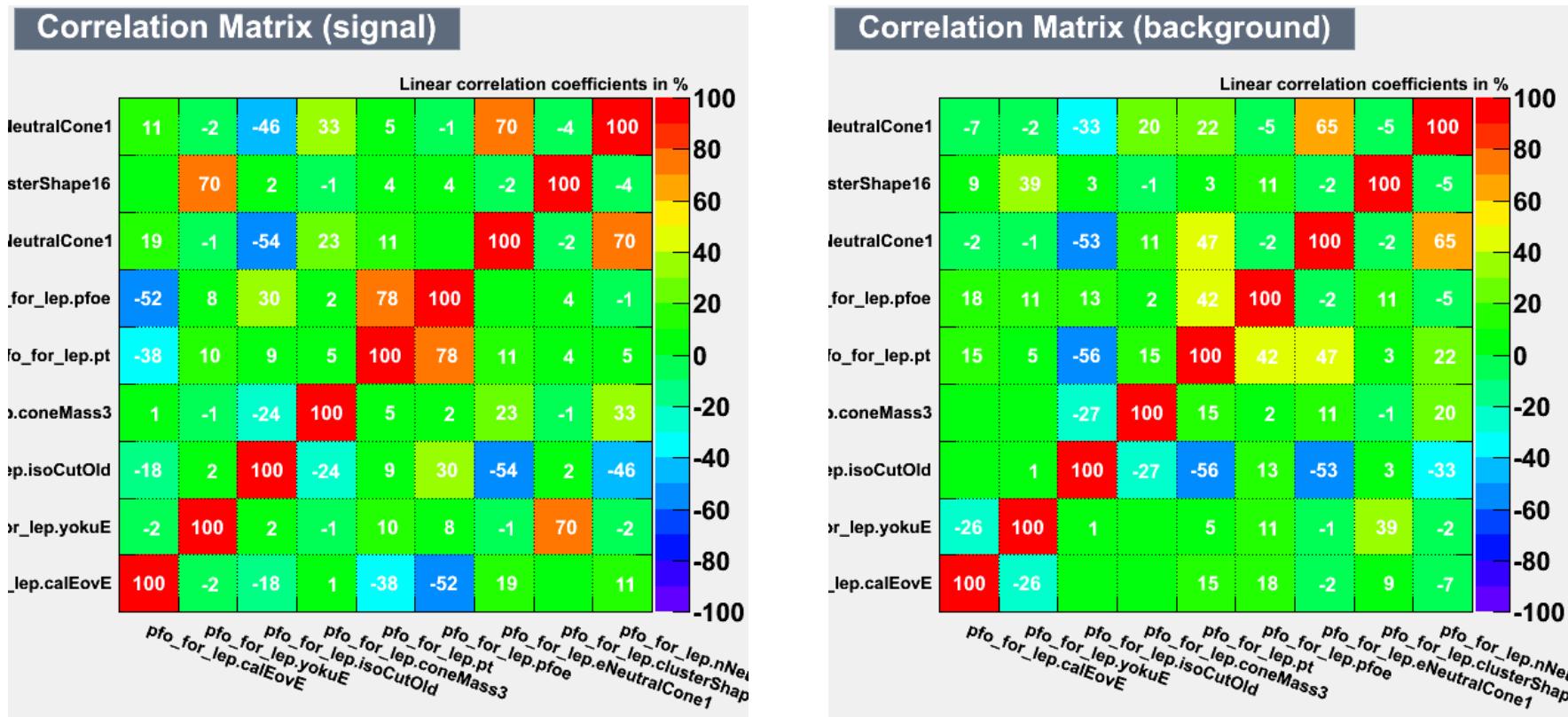
BDT input variables mu-taum 1



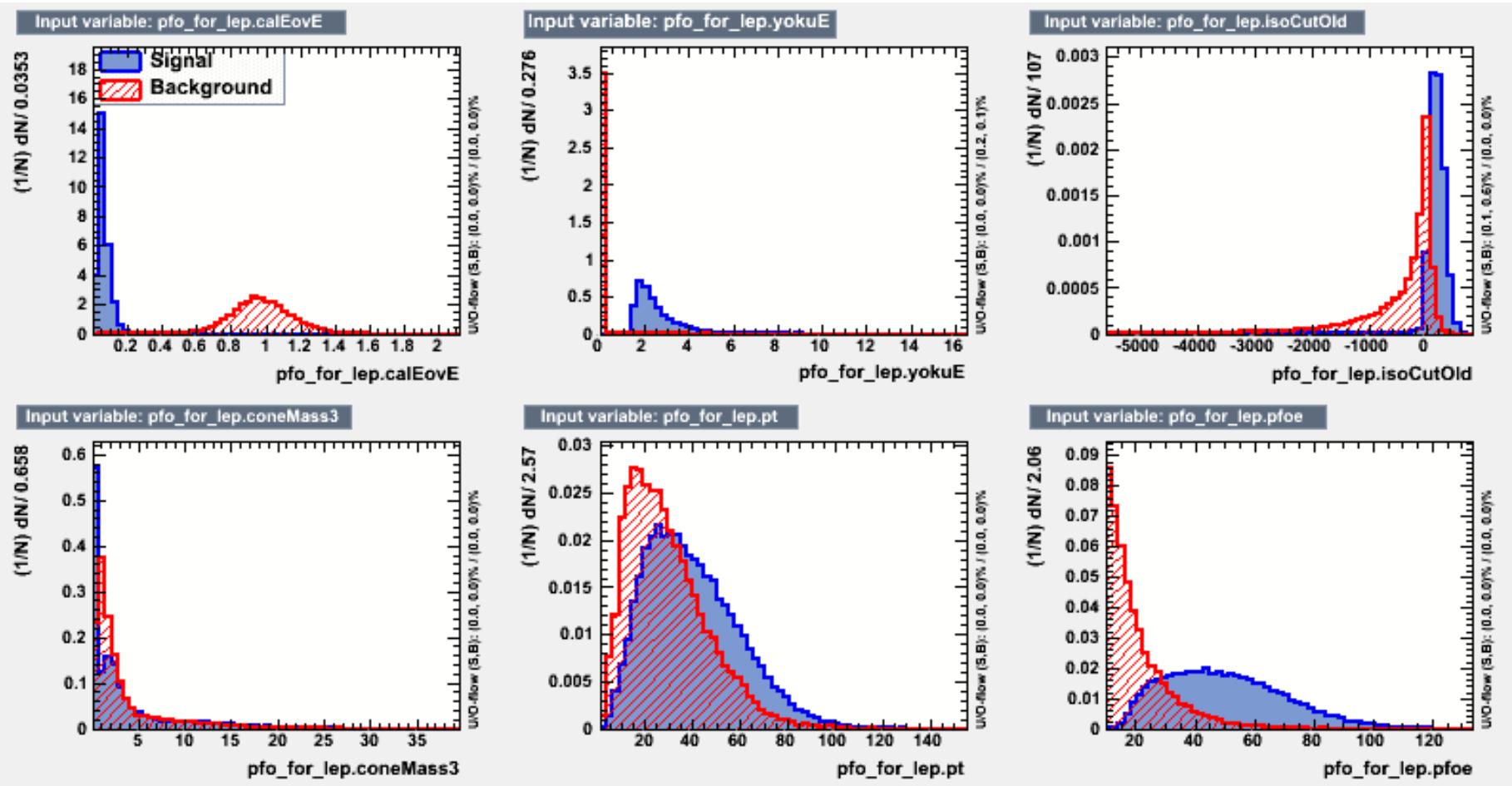
Correlation

muon

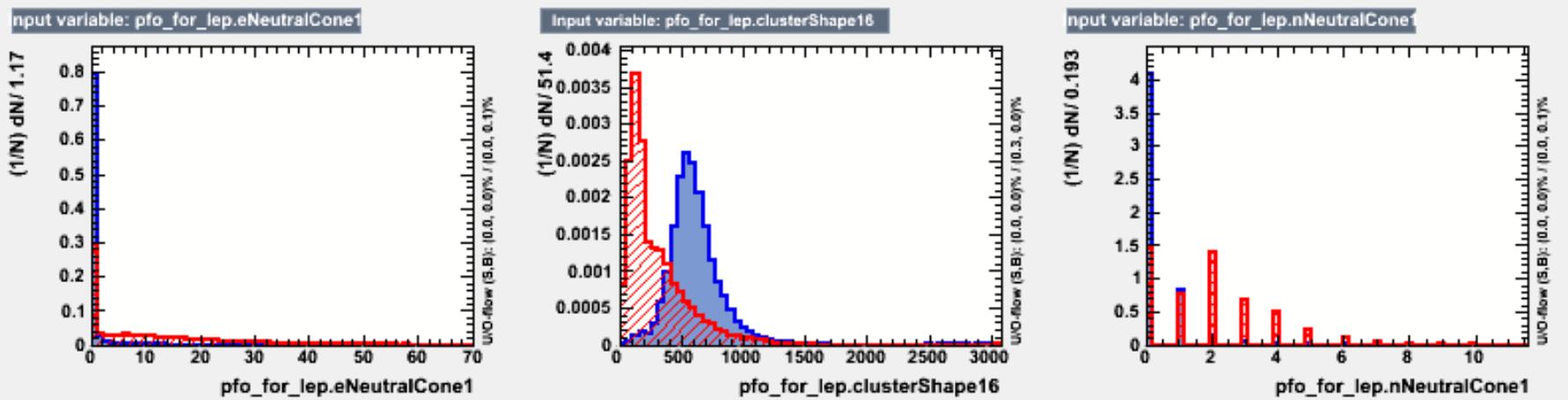
tau(h)



BDT input variables mu-tauh 1



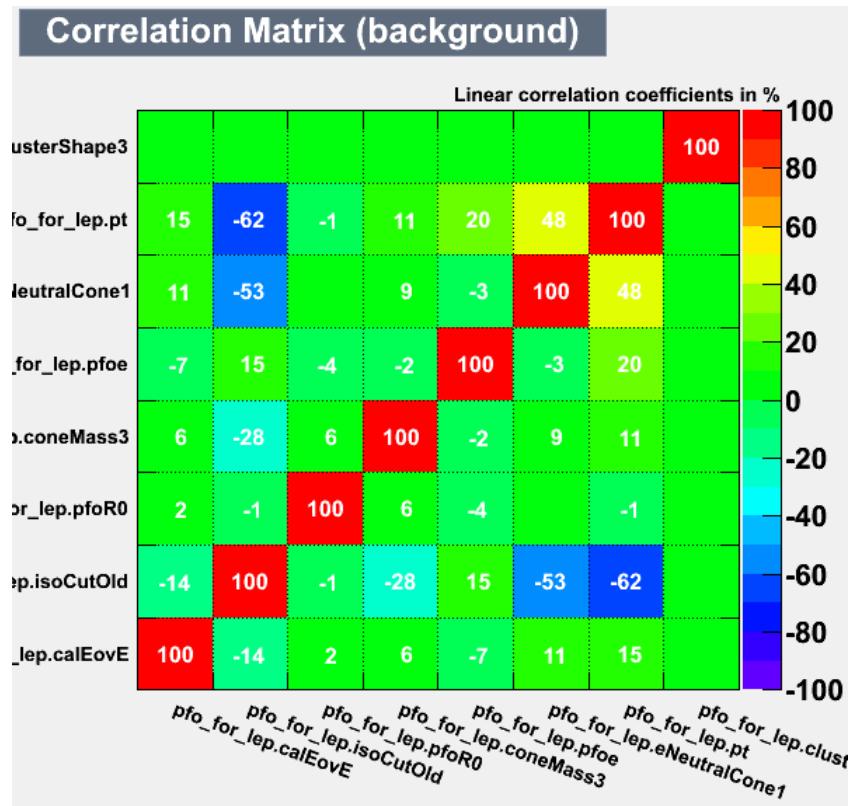
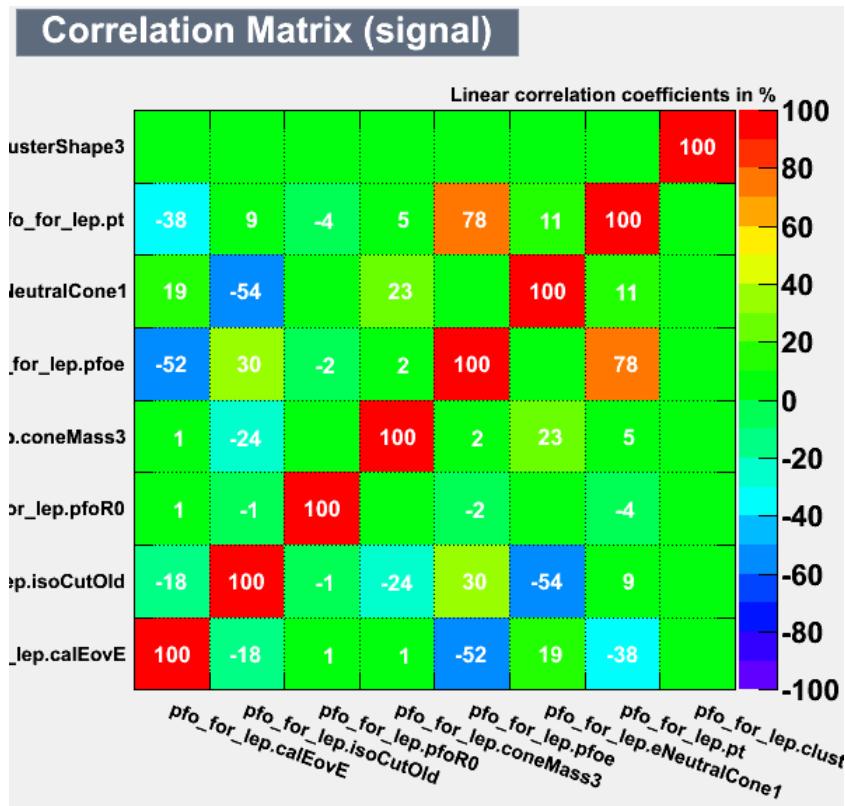
BDT input variables mu-tauh 2



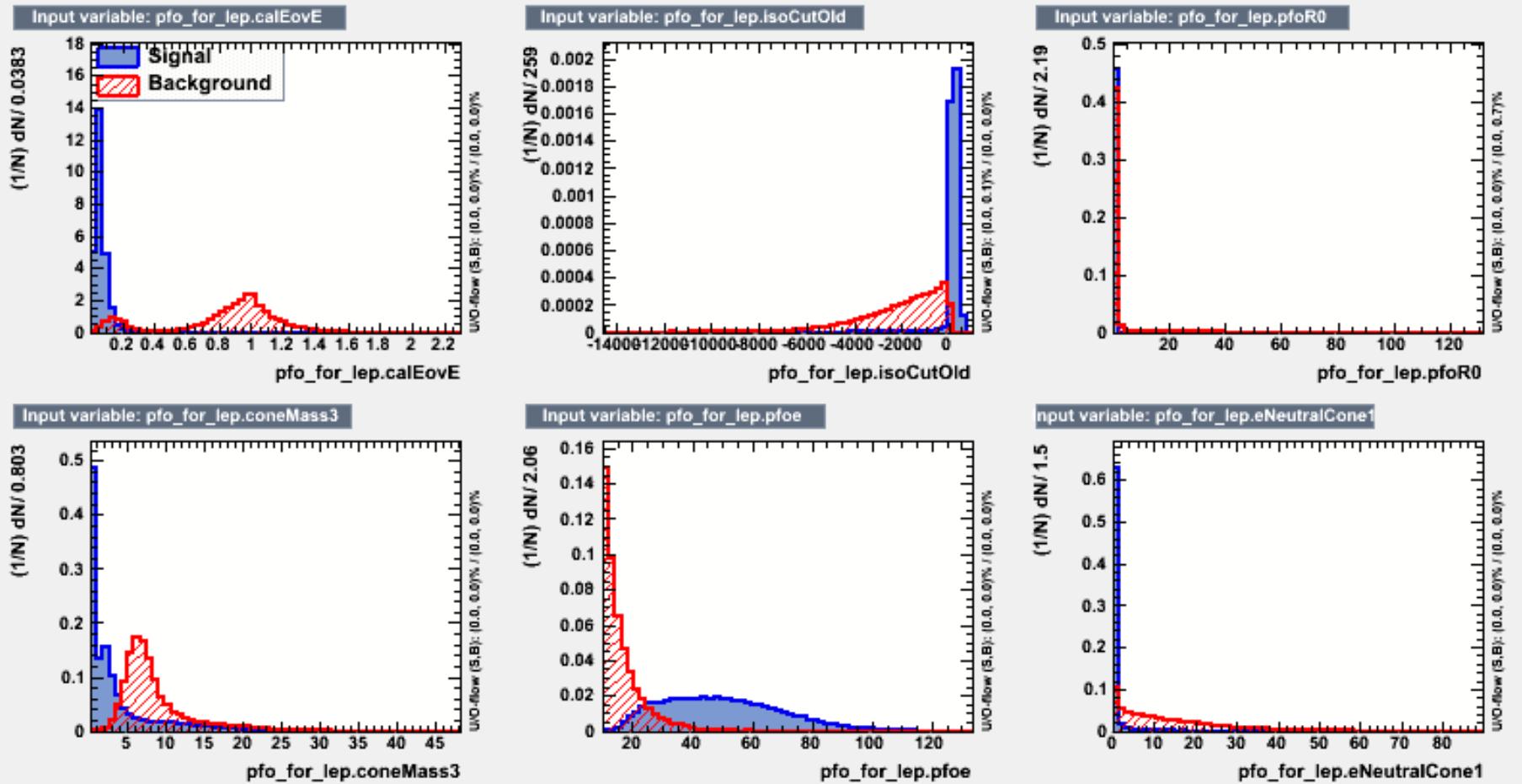
Correlation

muon

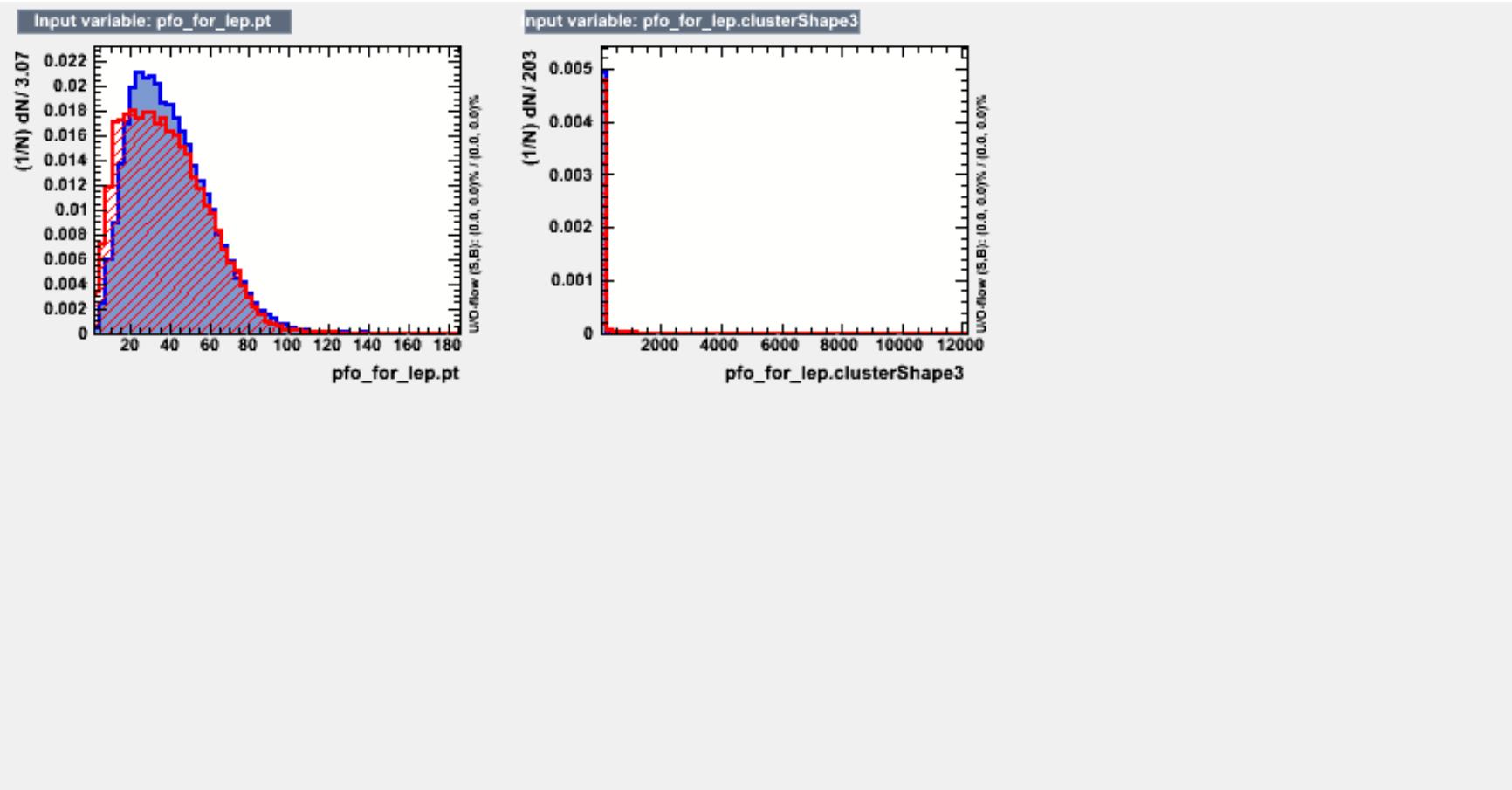
b jet



BDT input variables mu-bjet 1

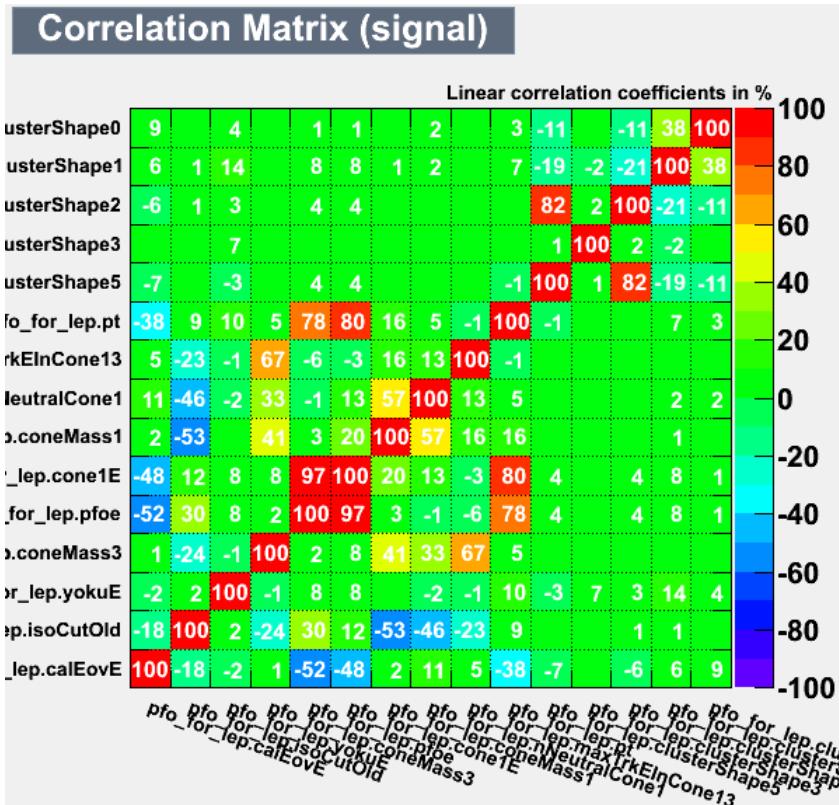


BDT input variables mu-bjet 2

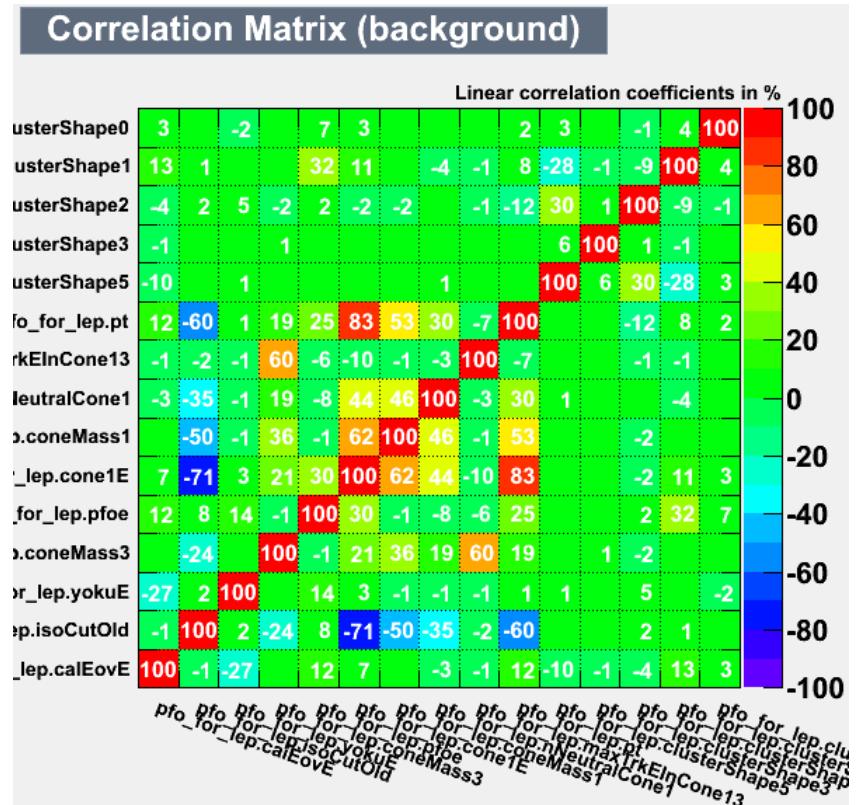


Correlation

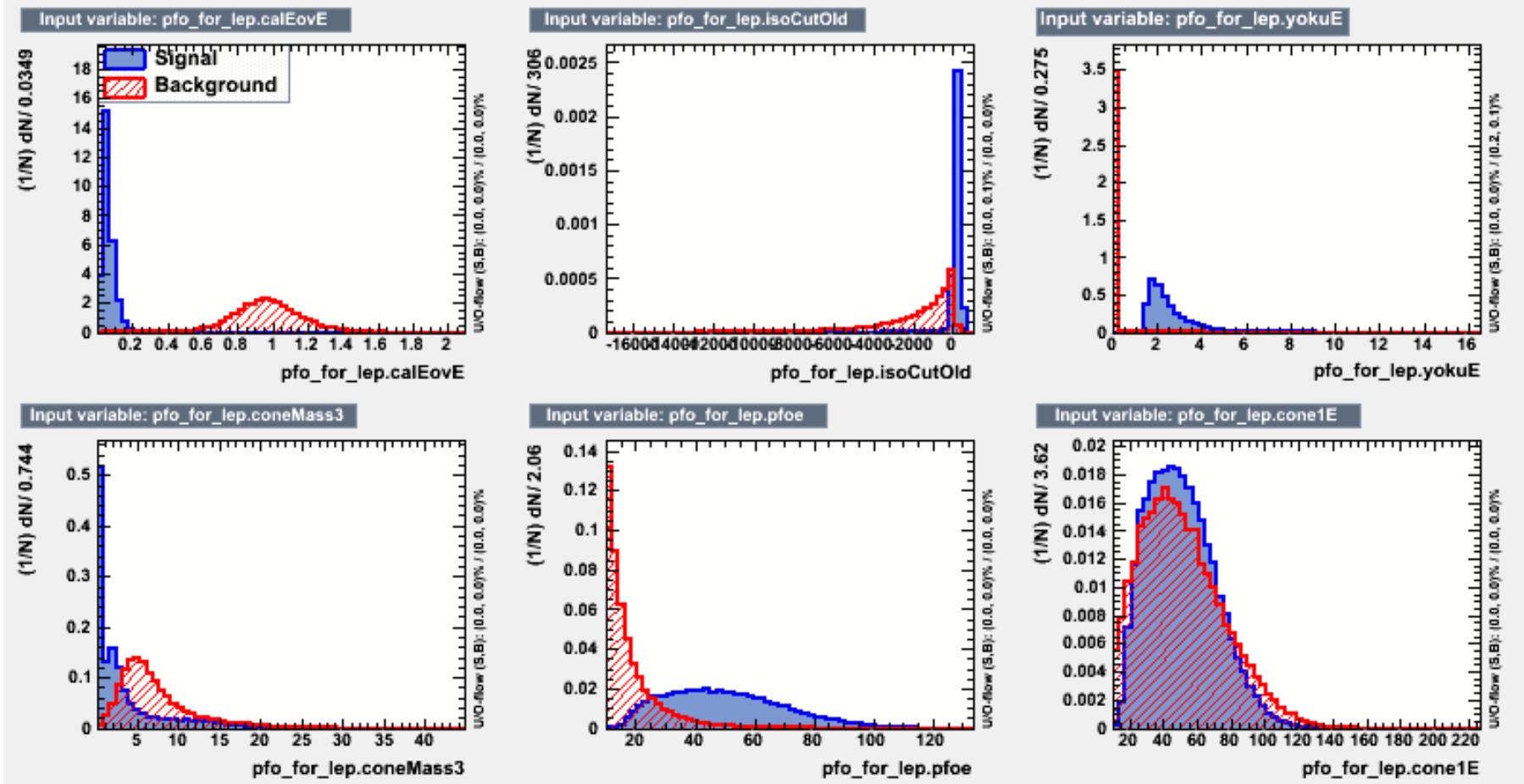
muon



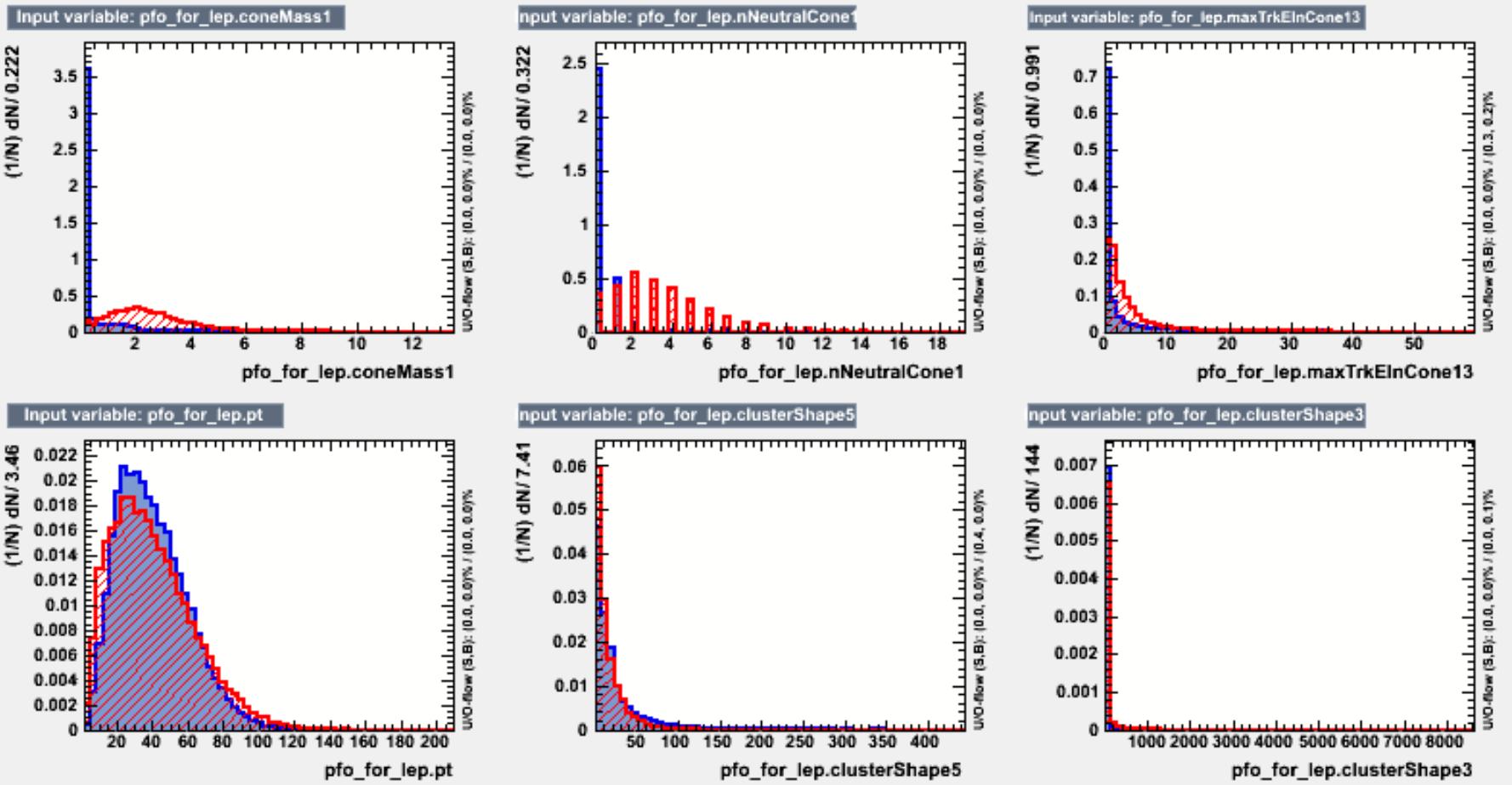
if jet



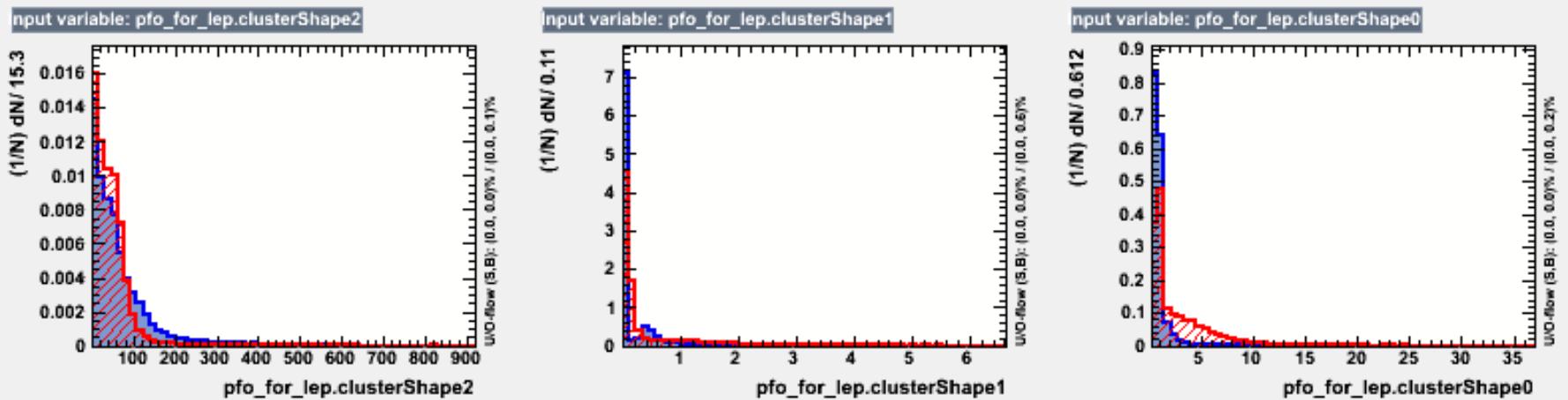
BDT input variables mu-lfjet 1



BDT input variables mu-lfjet 2



BDT input variables mu-lfjet 3

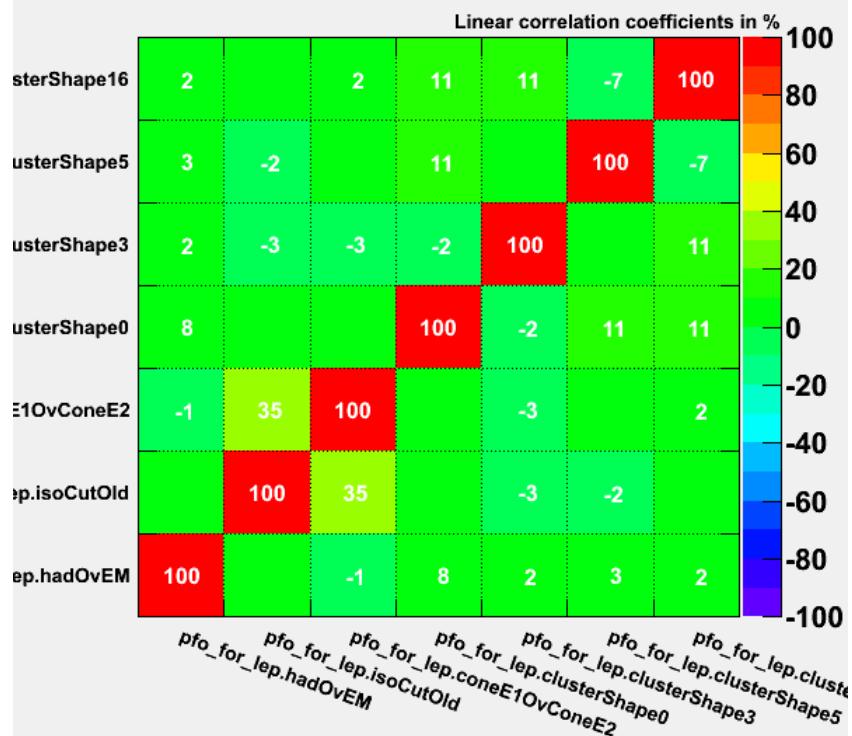


Correlation

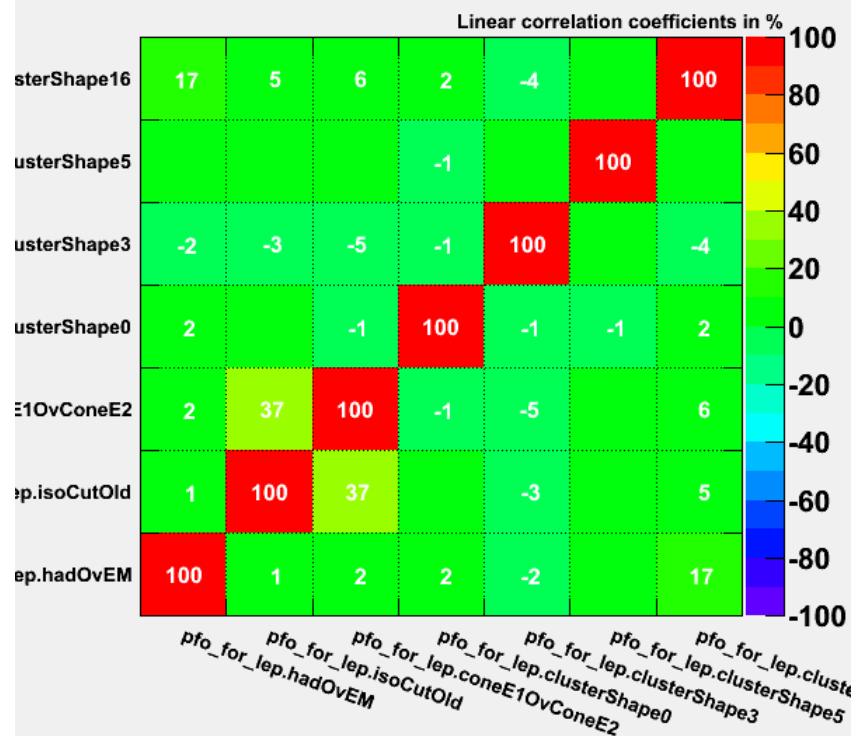
$\tau(e)$

$\tau(m)$

Correlation Matrix (signal)

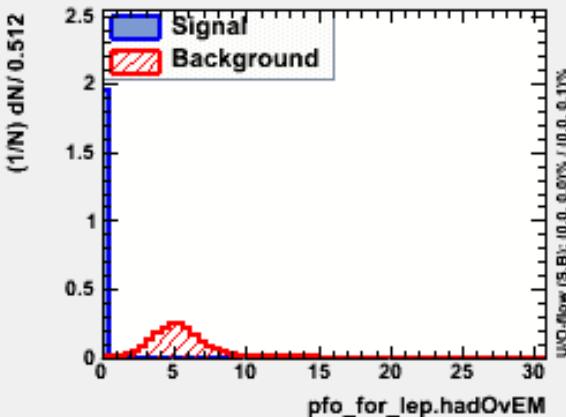


Correlation Matrix (background)

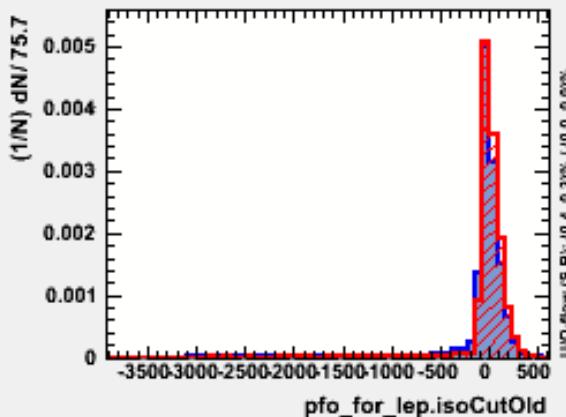


BDT input variables taue-taum 1

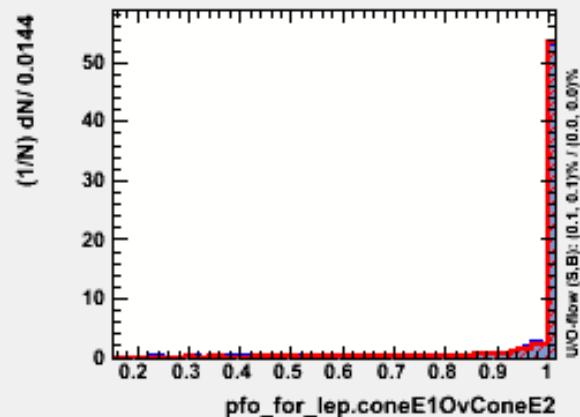
Input variable: pfo_for_lep.hadOvEM



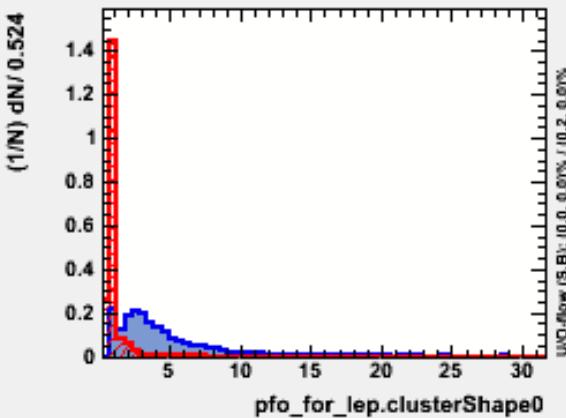
Input variable: pfo_for_lep.isoCutOld



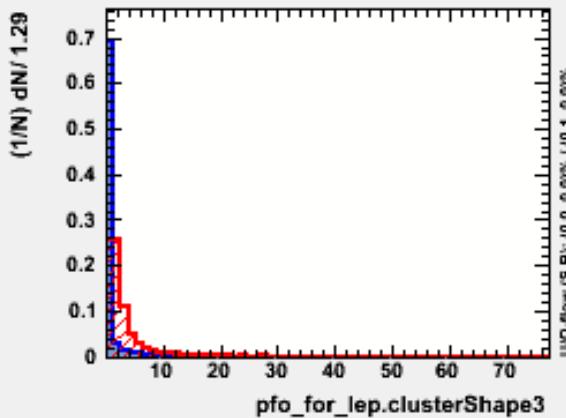
Input variable: pfo_for_lep.coneE1OvConeE2



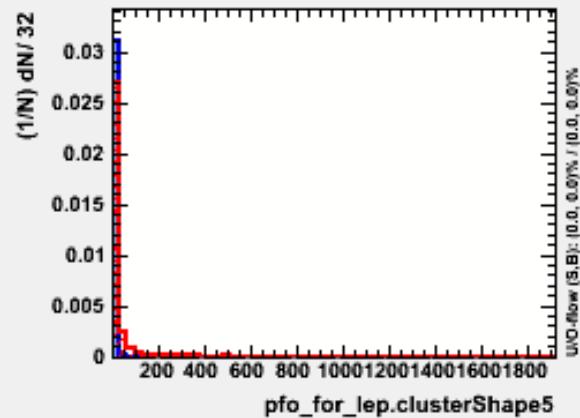
Input variable: pfo_for_lep.clusterShape0



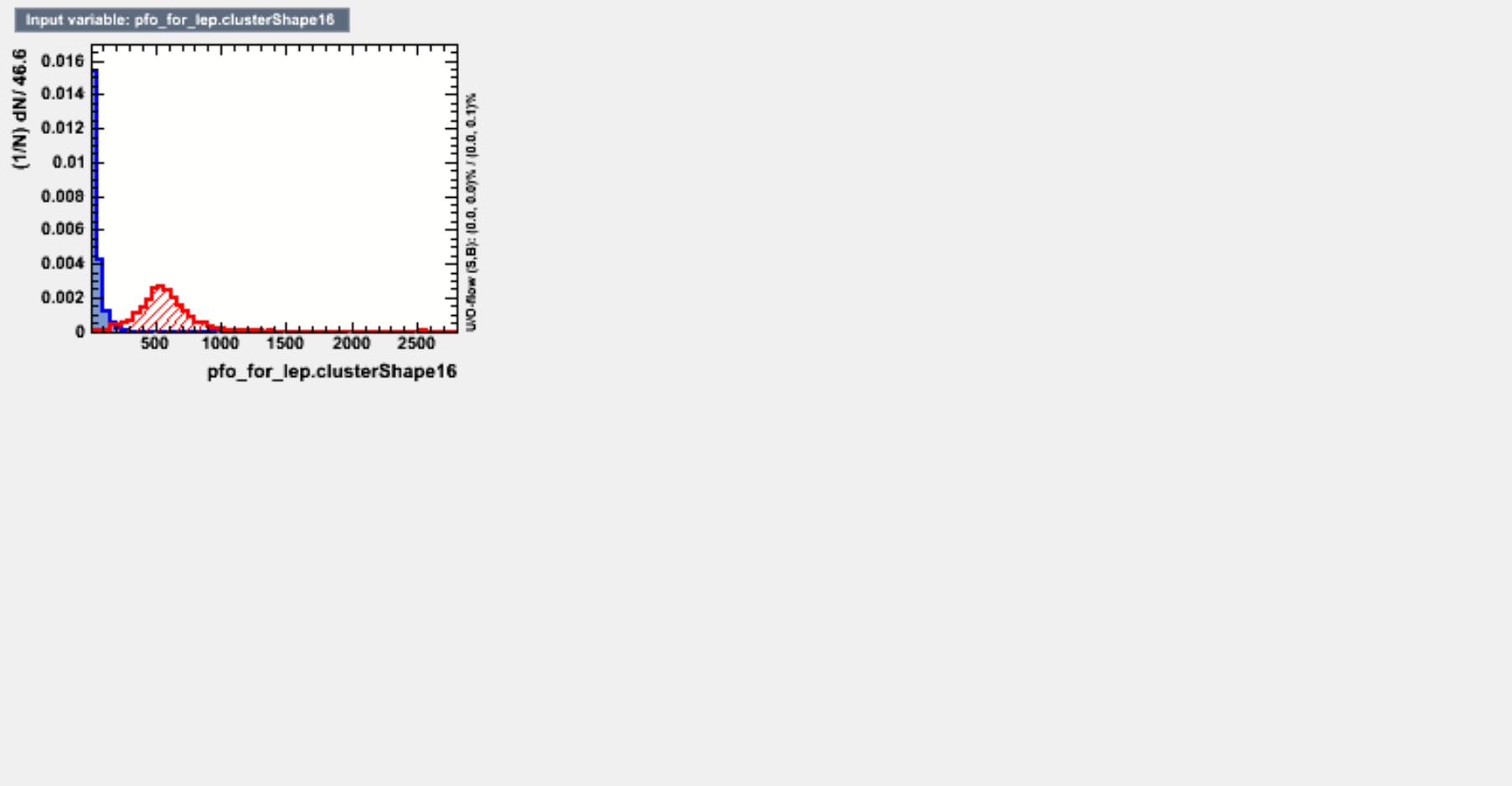
Input variable: pfo_for_lep.clusterShape3



Input variable: pfo_for_lep.clusterShape5



BDT input variables taue-taum 2

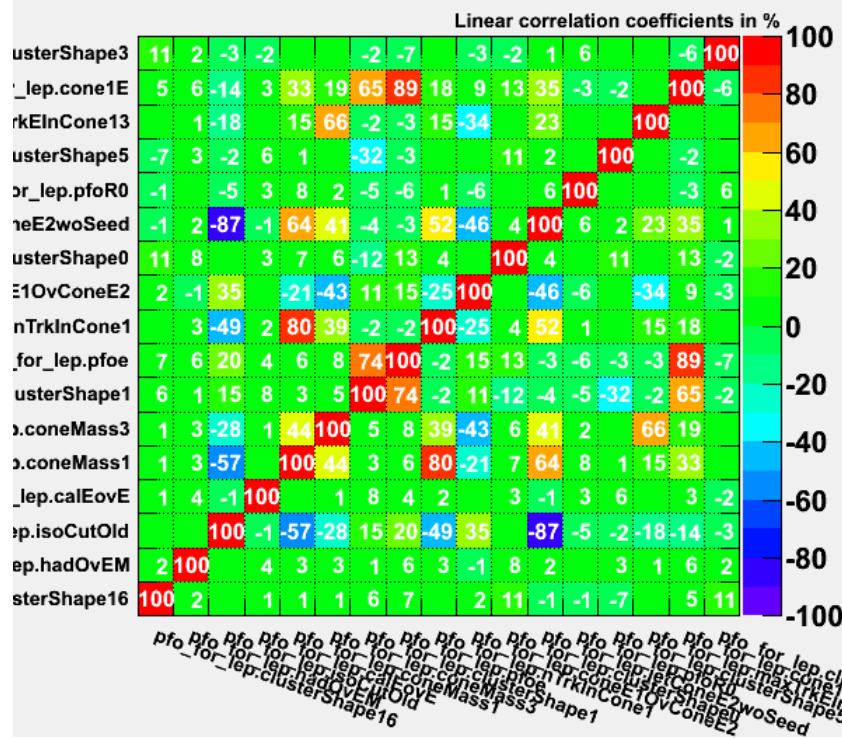


Correlation

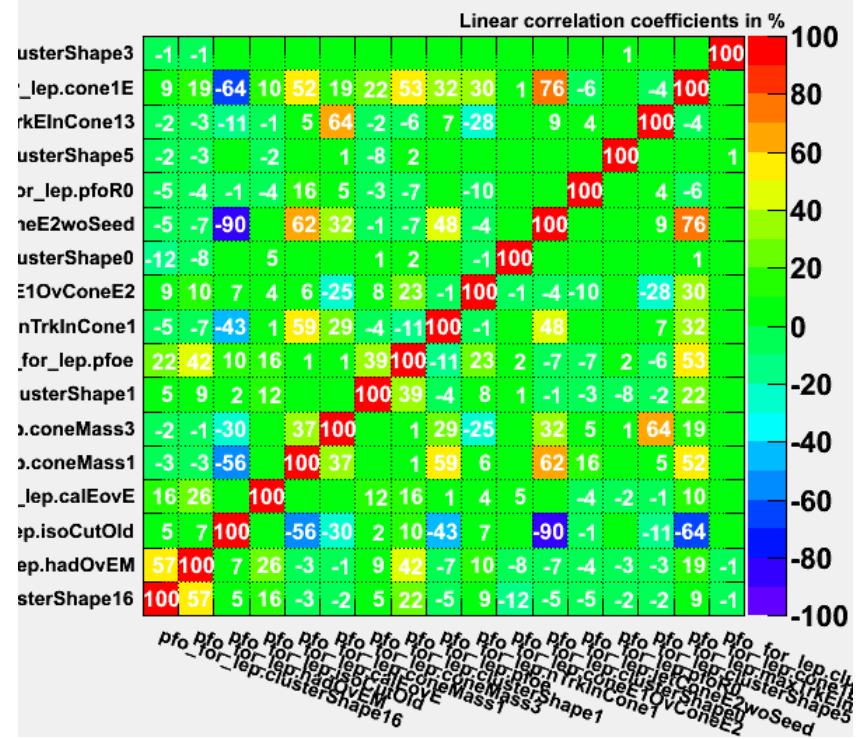
$\tau(e)$

$\tau(h)$

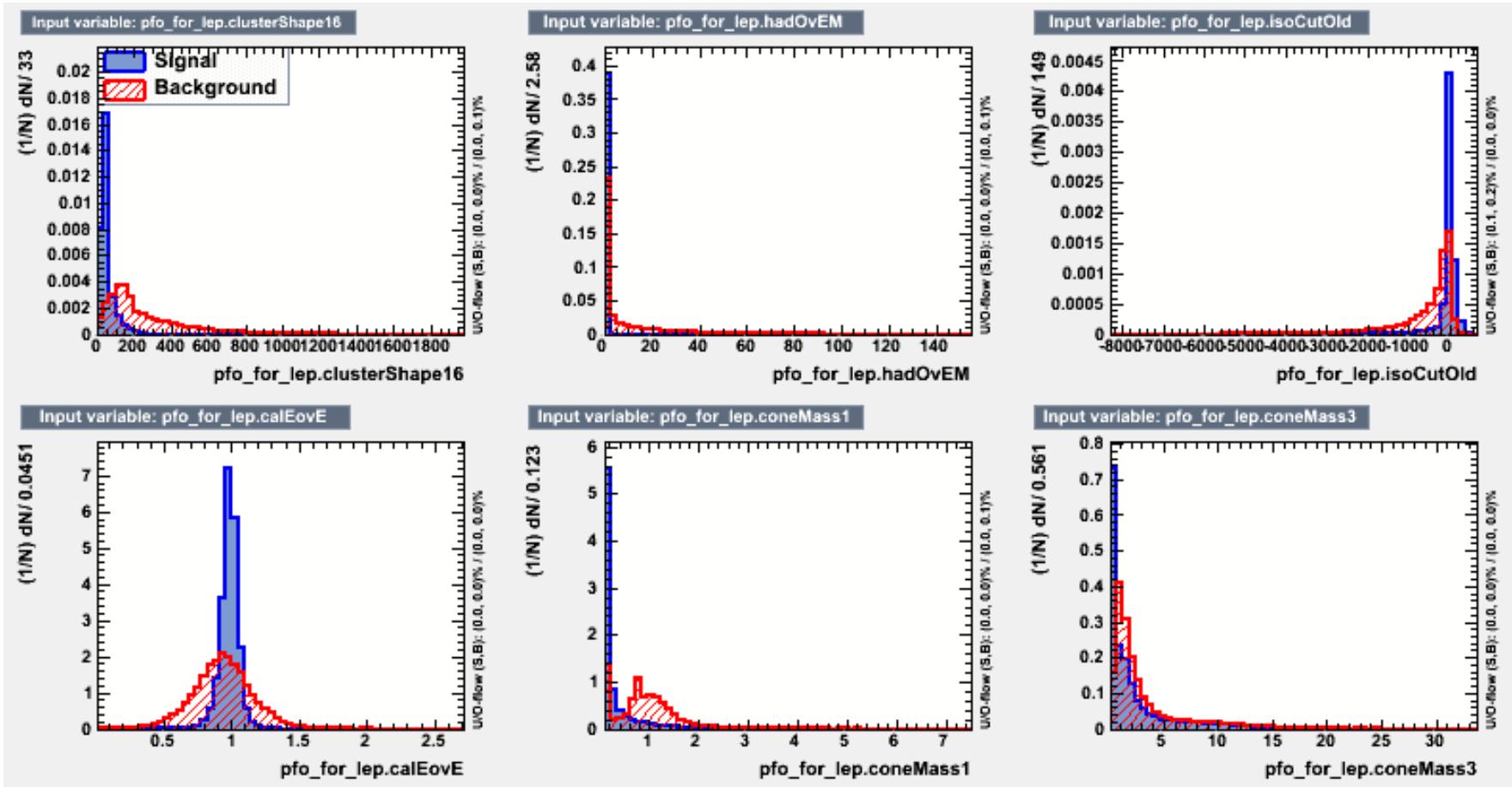
Correlation Matrix (signal)



Correlation Matrix (background)

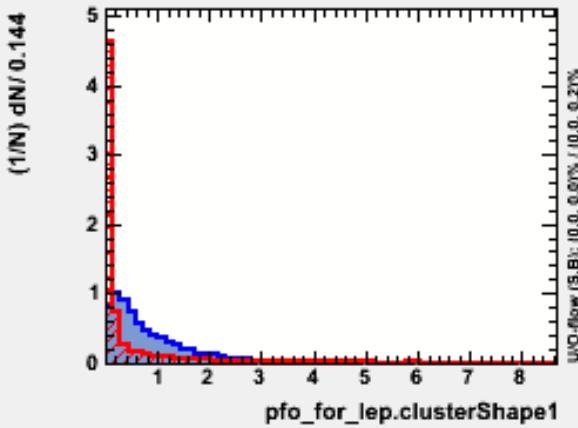


BDT input variables taue-tauh 1

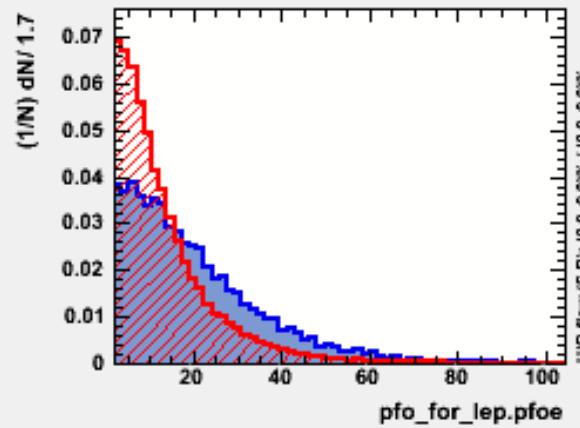


BDT input variables taue-tauh 2

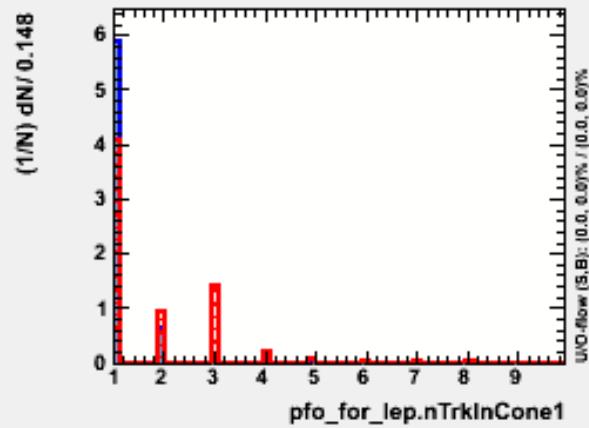
Input variable: pfo_for_lep.clusterShape1



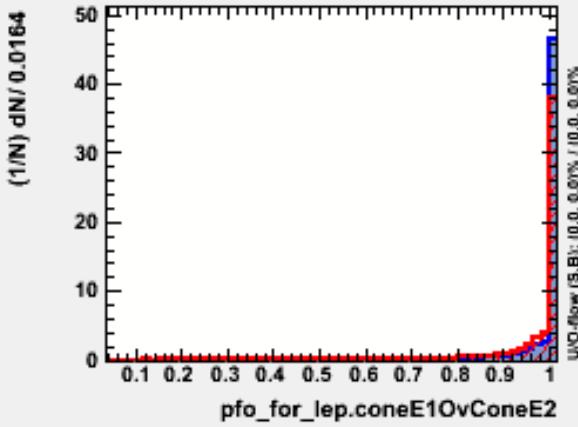
Input variable: pfo_for_lep.pfoe



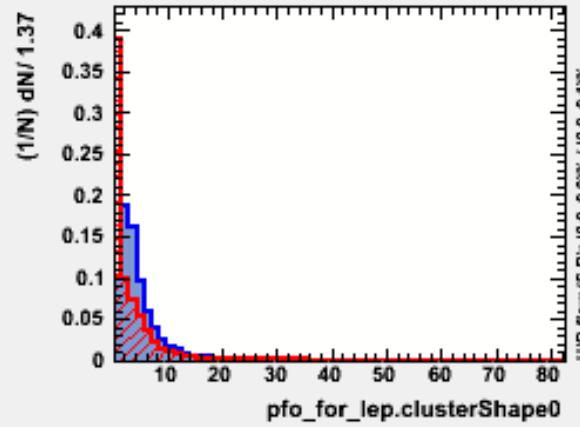
Input variable: pfo_for_lep.nTrkInCone1



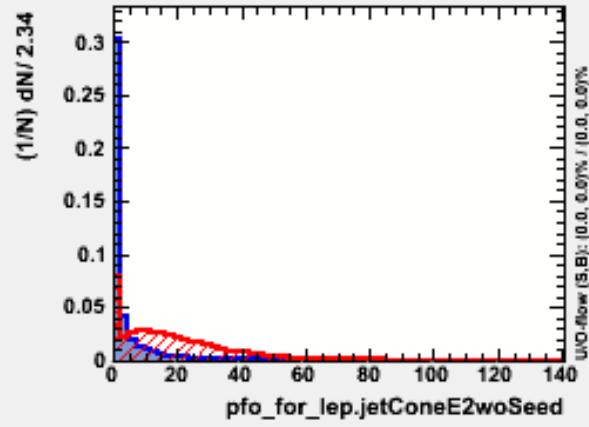
Input variable: pfo_for_lep.coneE1OvConeE2



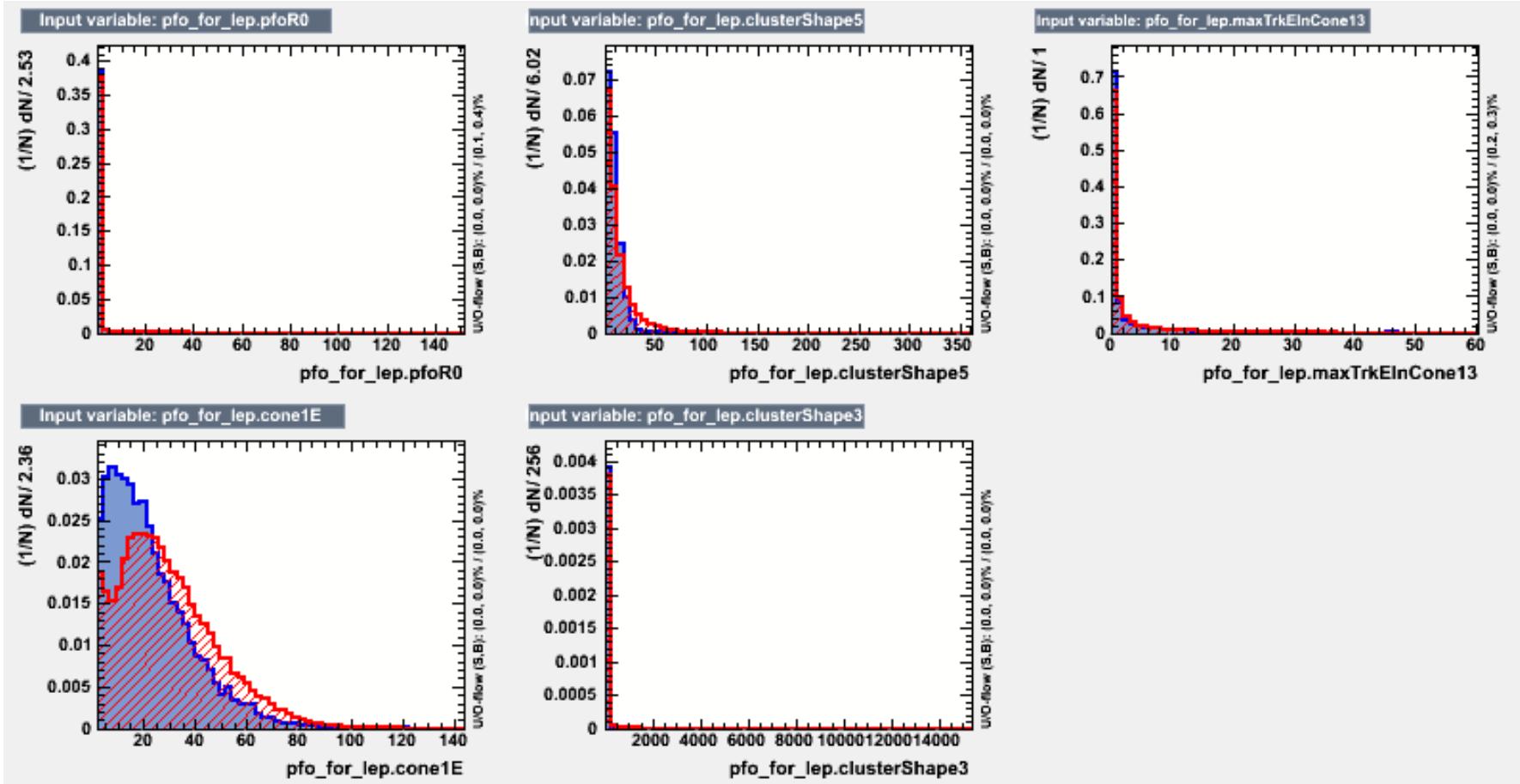
Input variable: pfo_for_lep.clusterShape0



Input variable: pfo_for_lep.jetConeE2woSeed

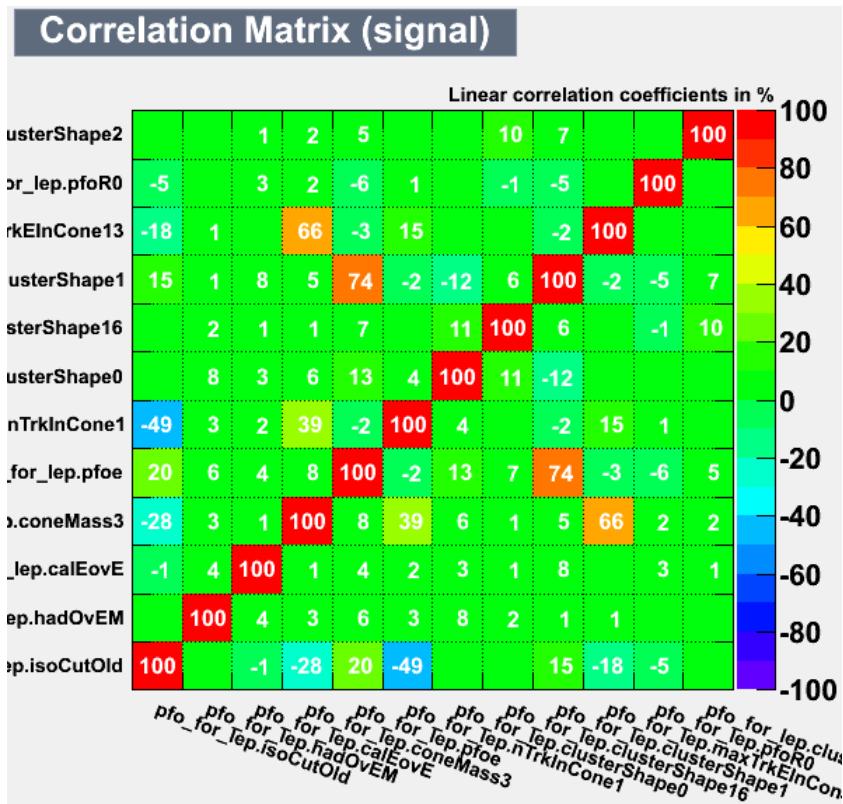


BDT input variables taue-tauh 3

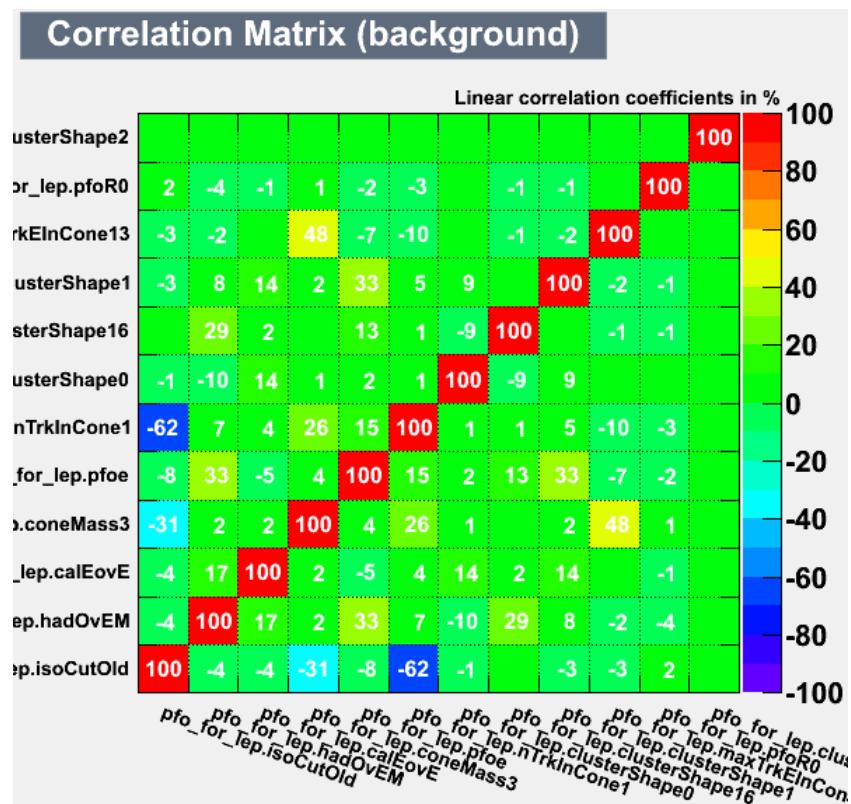


Correlation

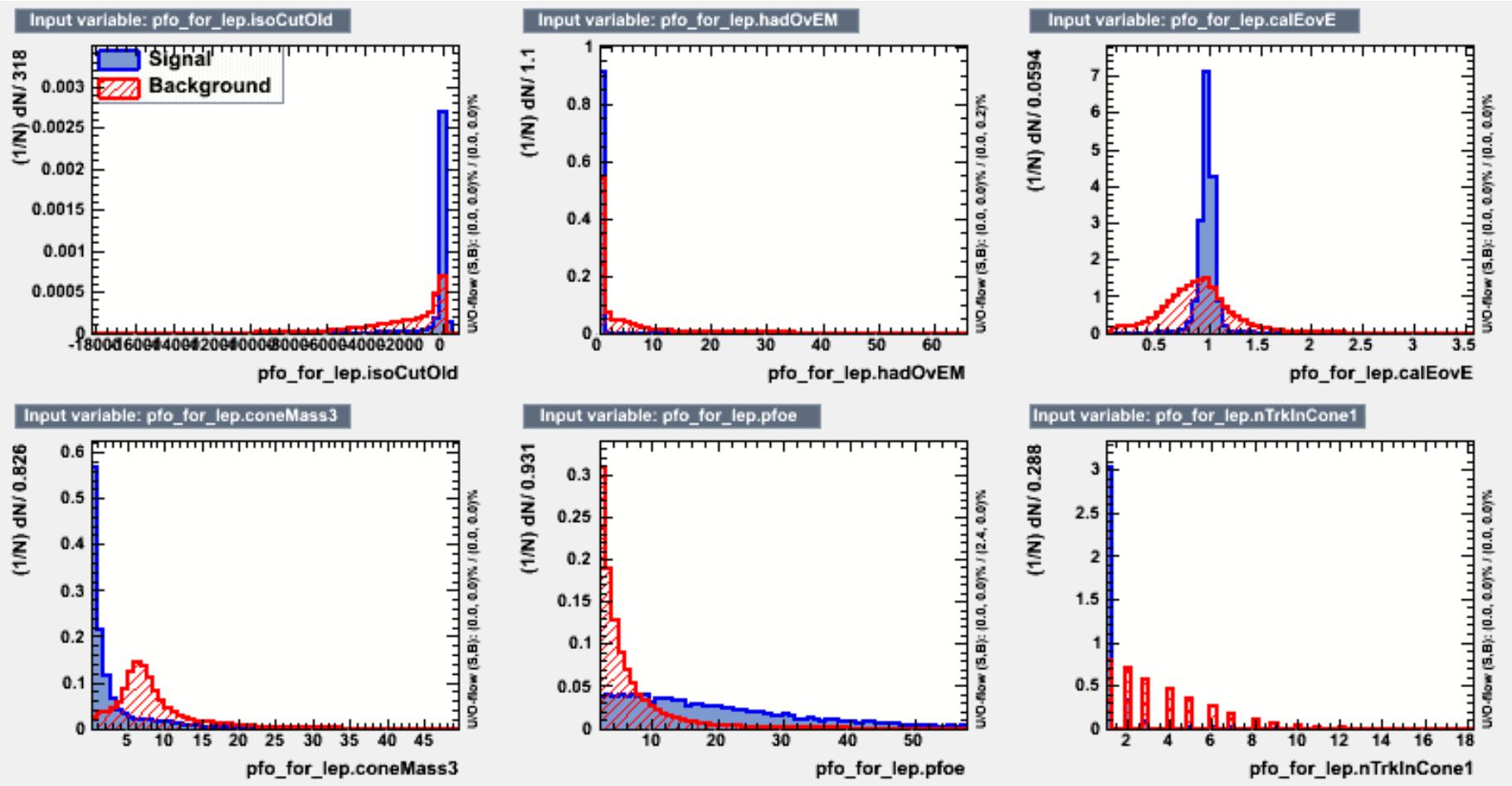
tau(e)



b jet

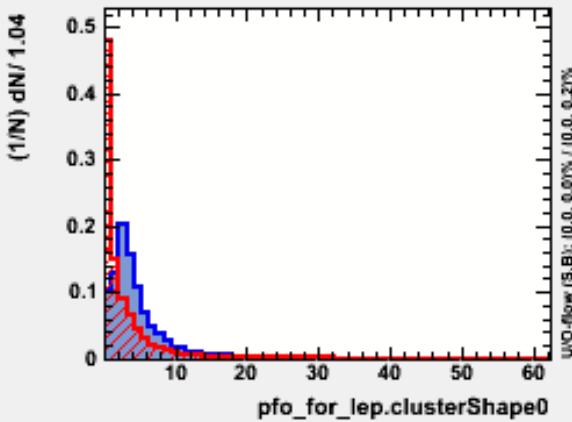


BDT input variables tau-e-bjet 1

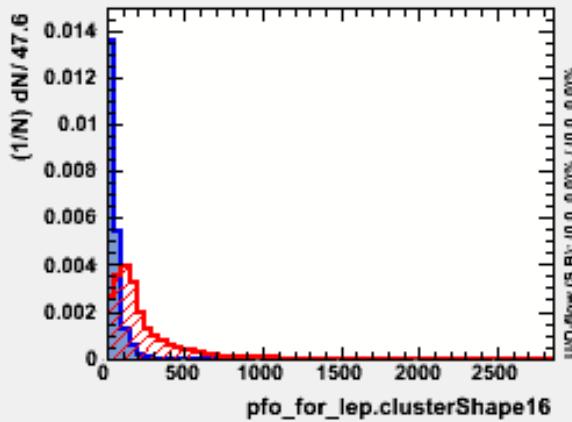


BDT input variables taue-bjet 2

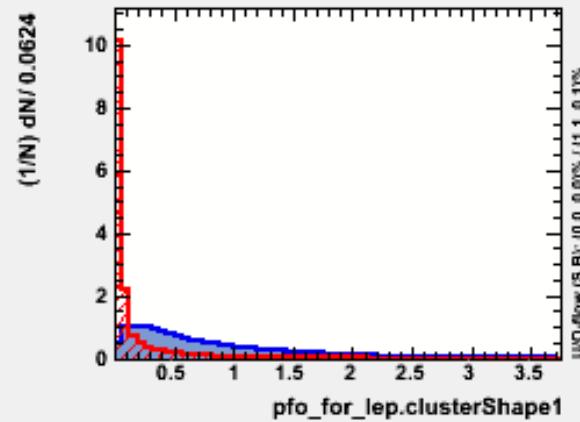
Input variable: pfo_for_lep.clusterShape0



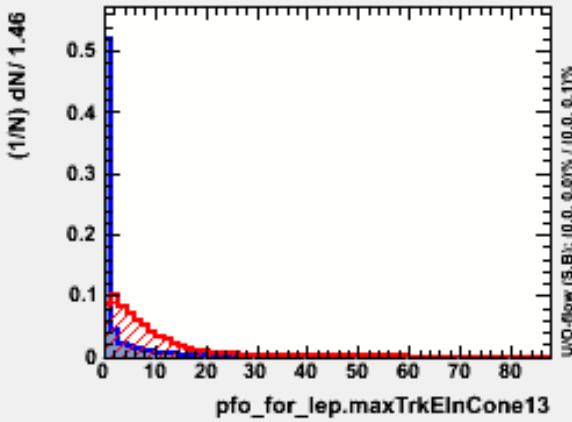
Input variable: pfo_for_lep.clusterShape16



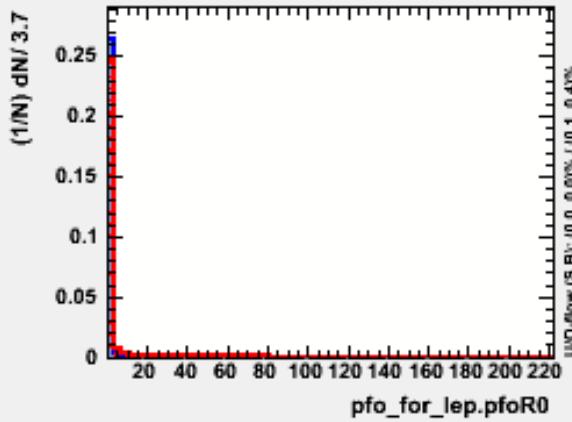
Input variable: pfo_for_lep.clusterShape1



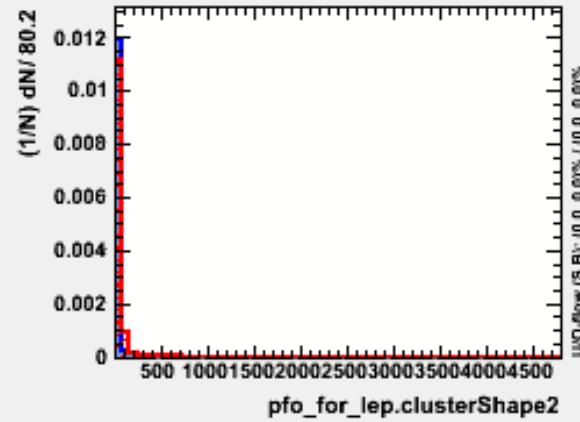
Input variable: pfo_for_lep.maxTrkEInCone13



Input variable: pfo_for_lep.pfoR0

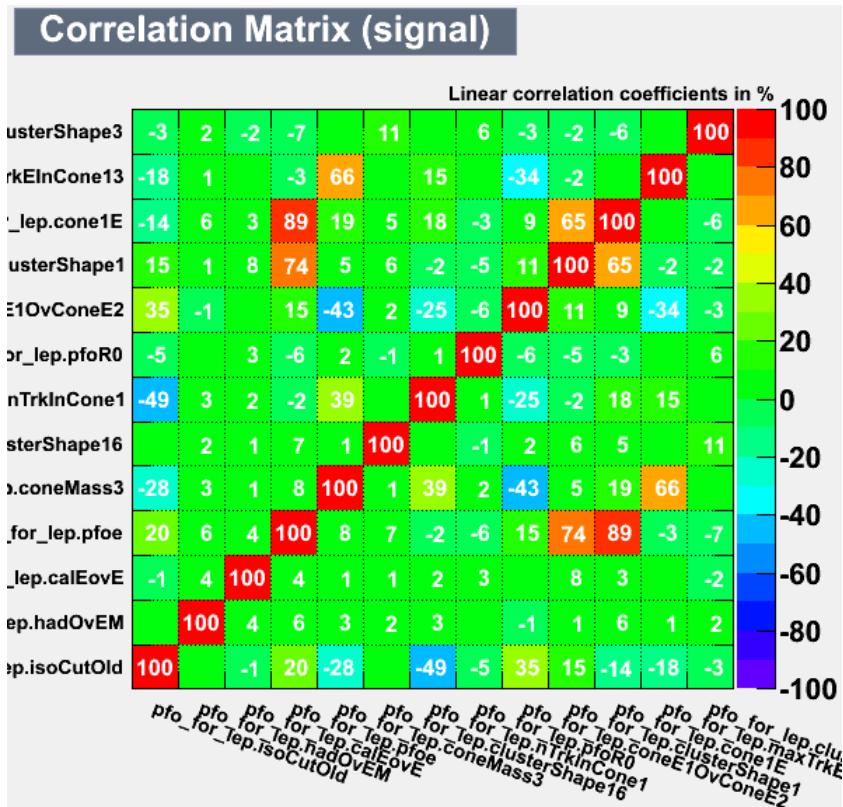


Input variable: pfo_for_lep.clusterShape2

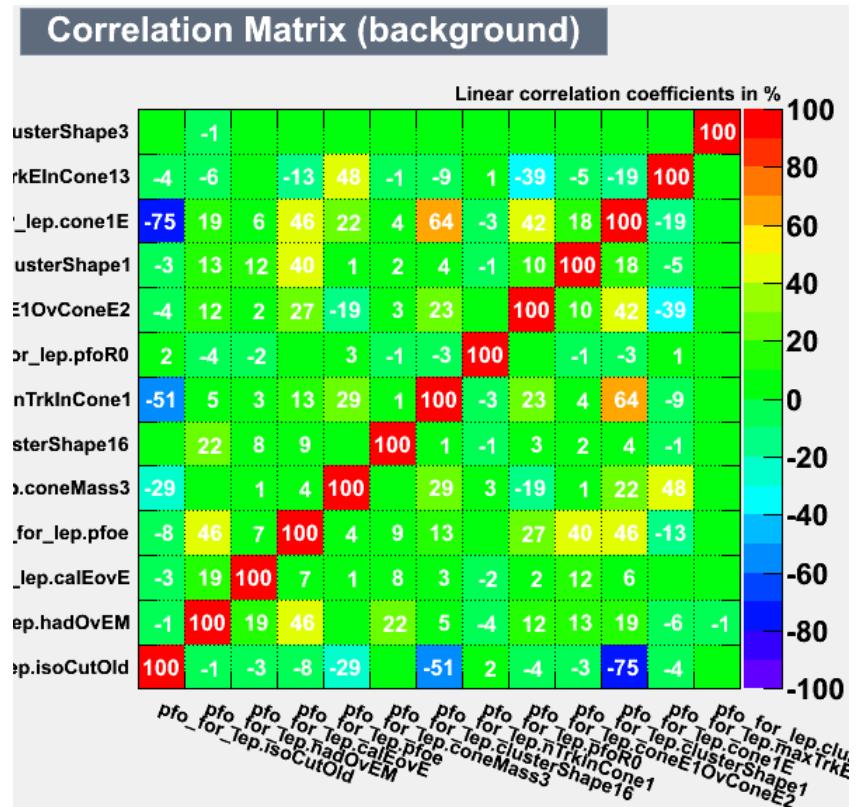


Correlation

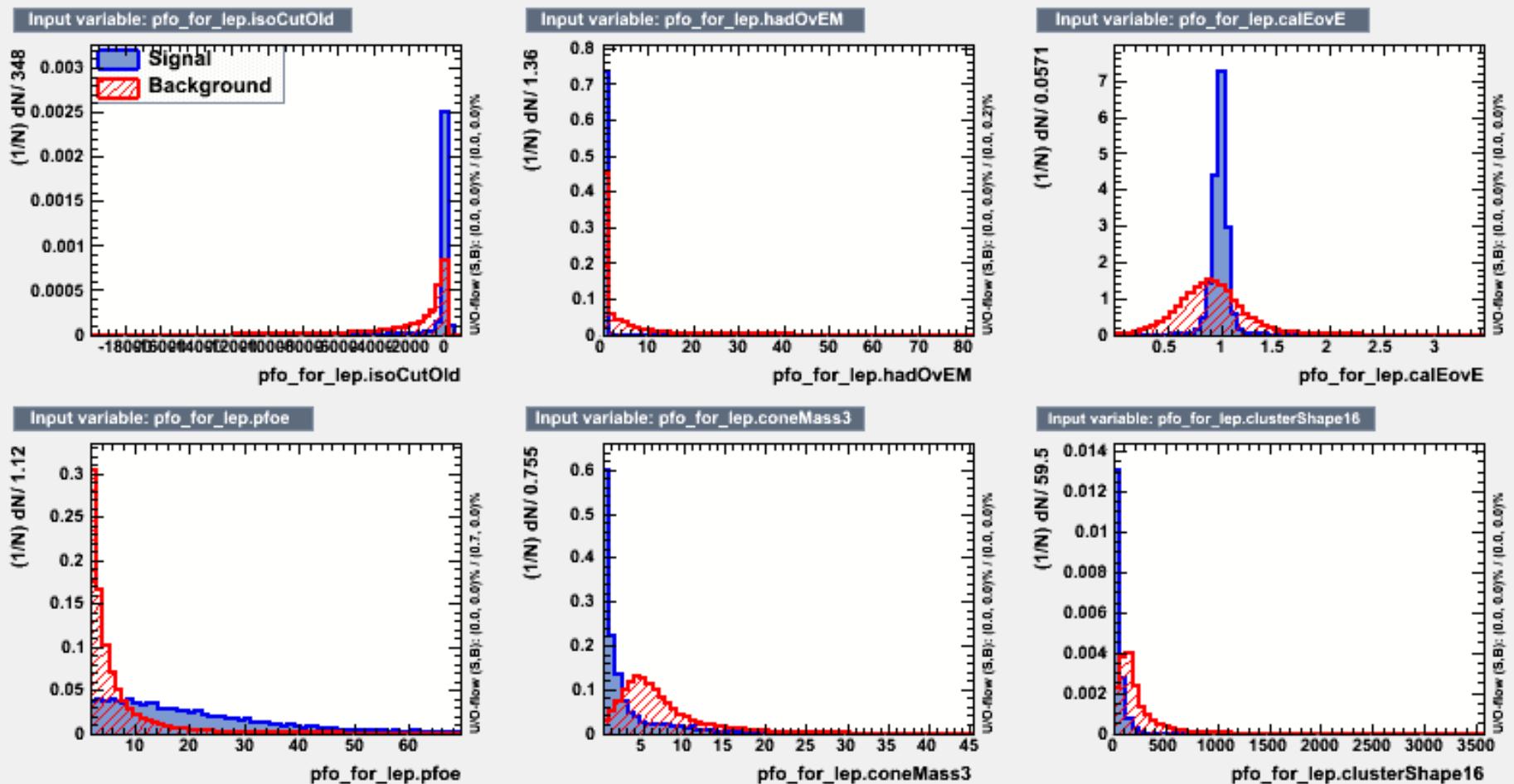
$\tau(e)$



If jet

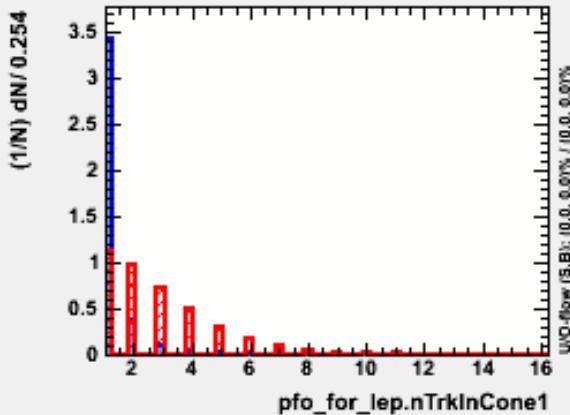


BDT input variables taue-lfjet 1

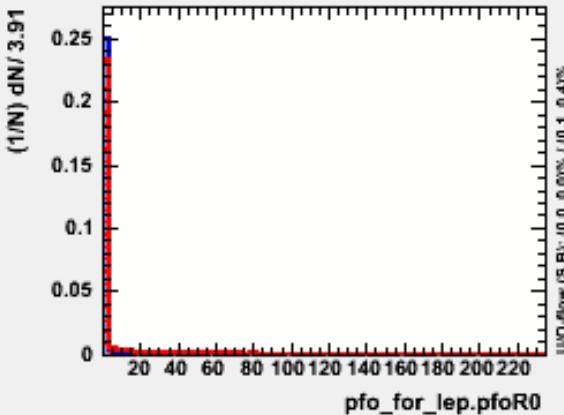


BDT input variables taue-lfjet 2

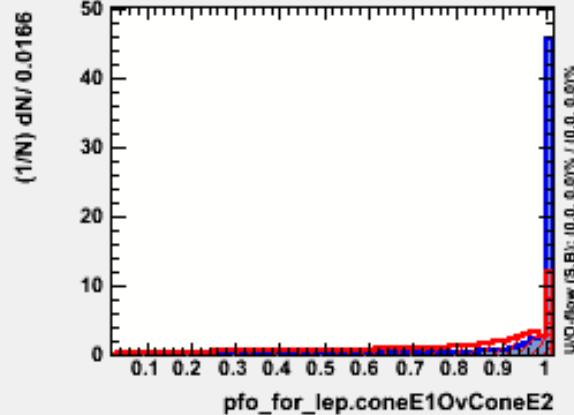
Input variable: pfo_for_lep.nTrkInCone1



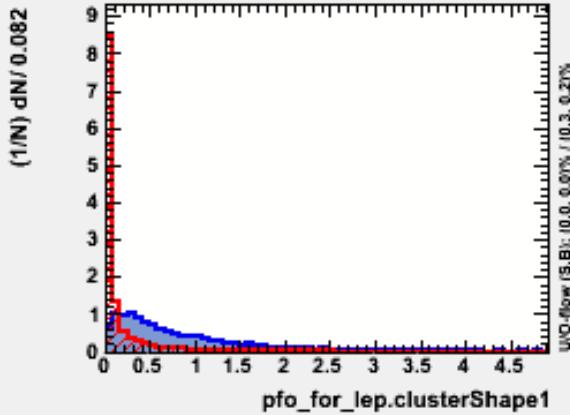
Input variable: pfo_for_lep.pfoR0



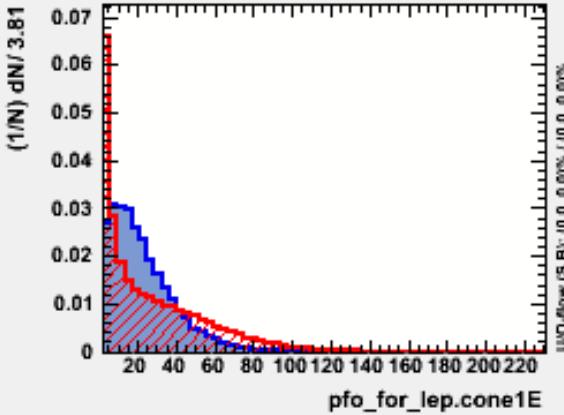
Input variable: pfo_for_lep.coneE1OvConeE2



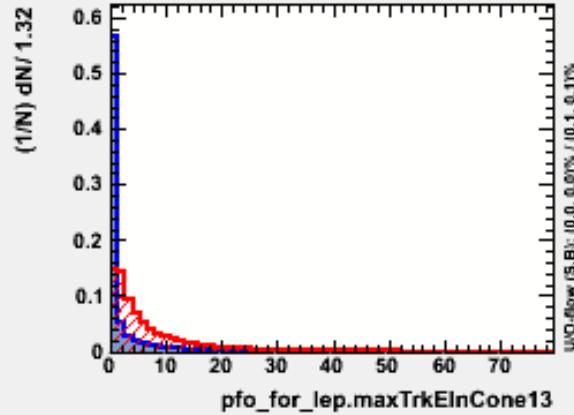
Input variable: pfo_for_lep.clusterShape1



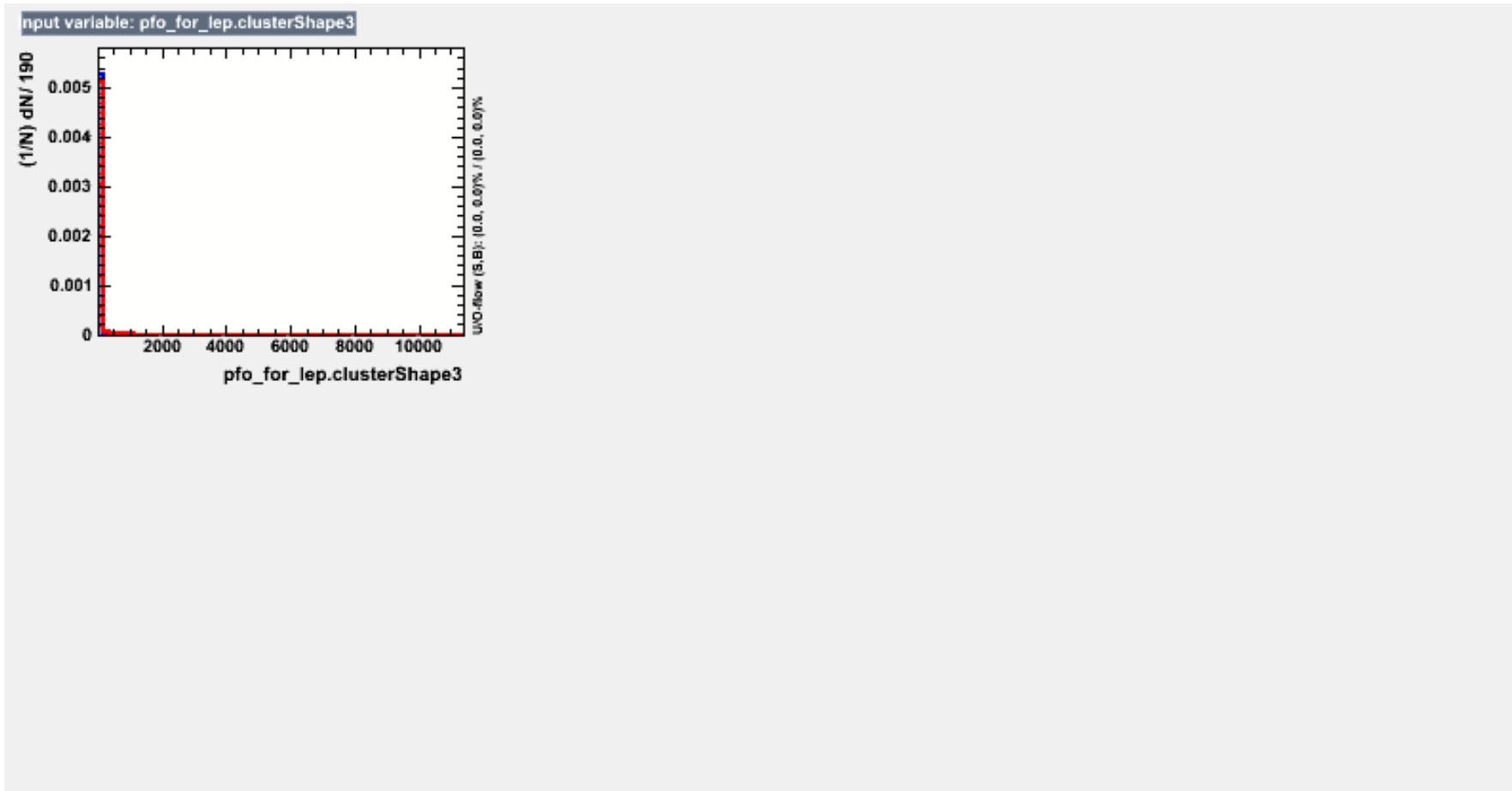
Input variable: pfo_for_lep.cone1E



Input variable: pfo_for_lep.maxTrkEInCone13



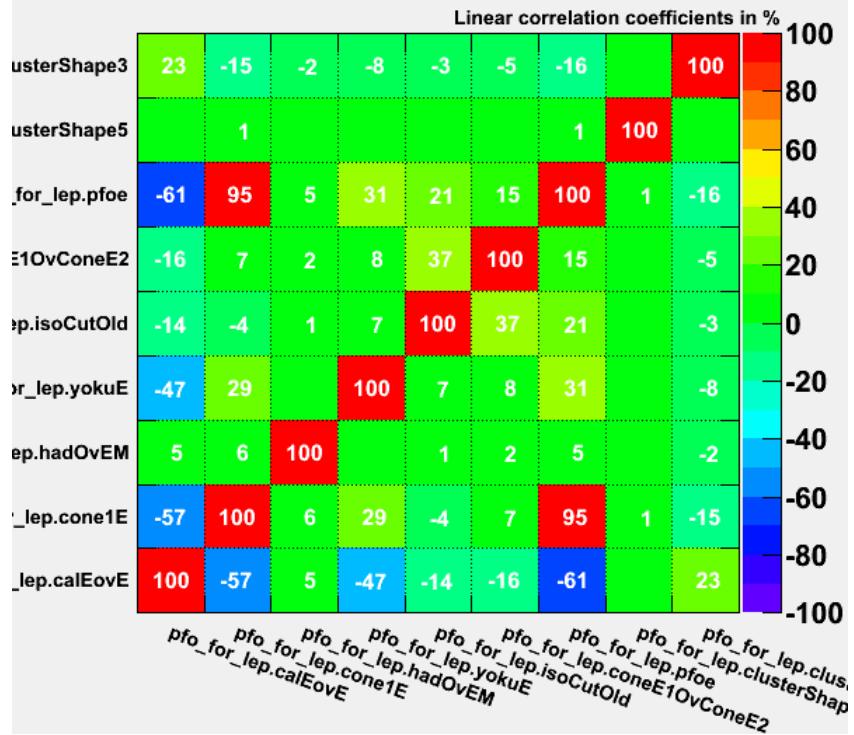
BDT input variables taue-lfjet 3



Correlation

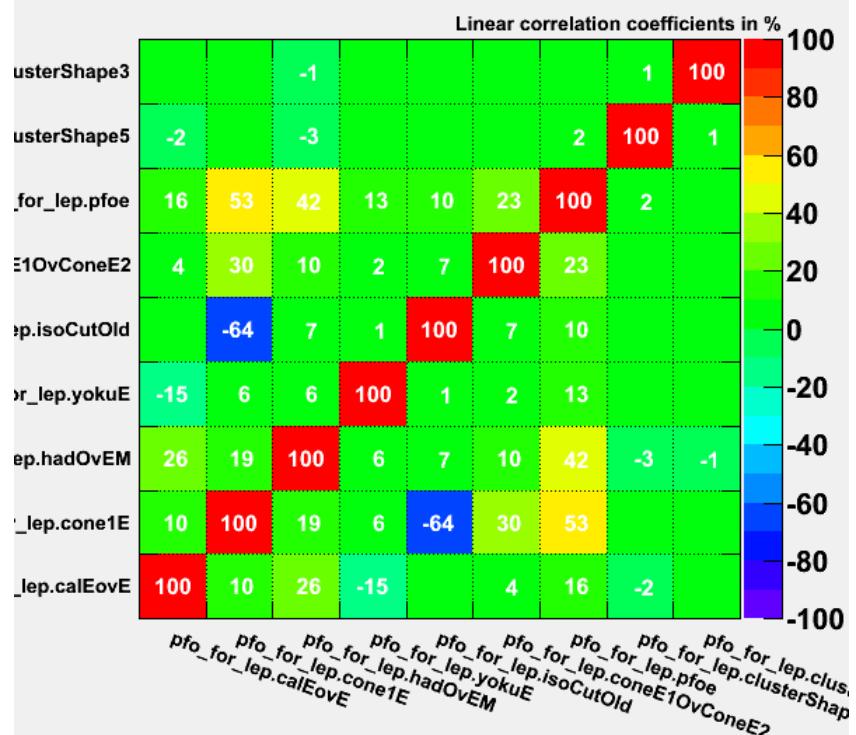
$\tau(m)$

Correlation Matrix (signal)

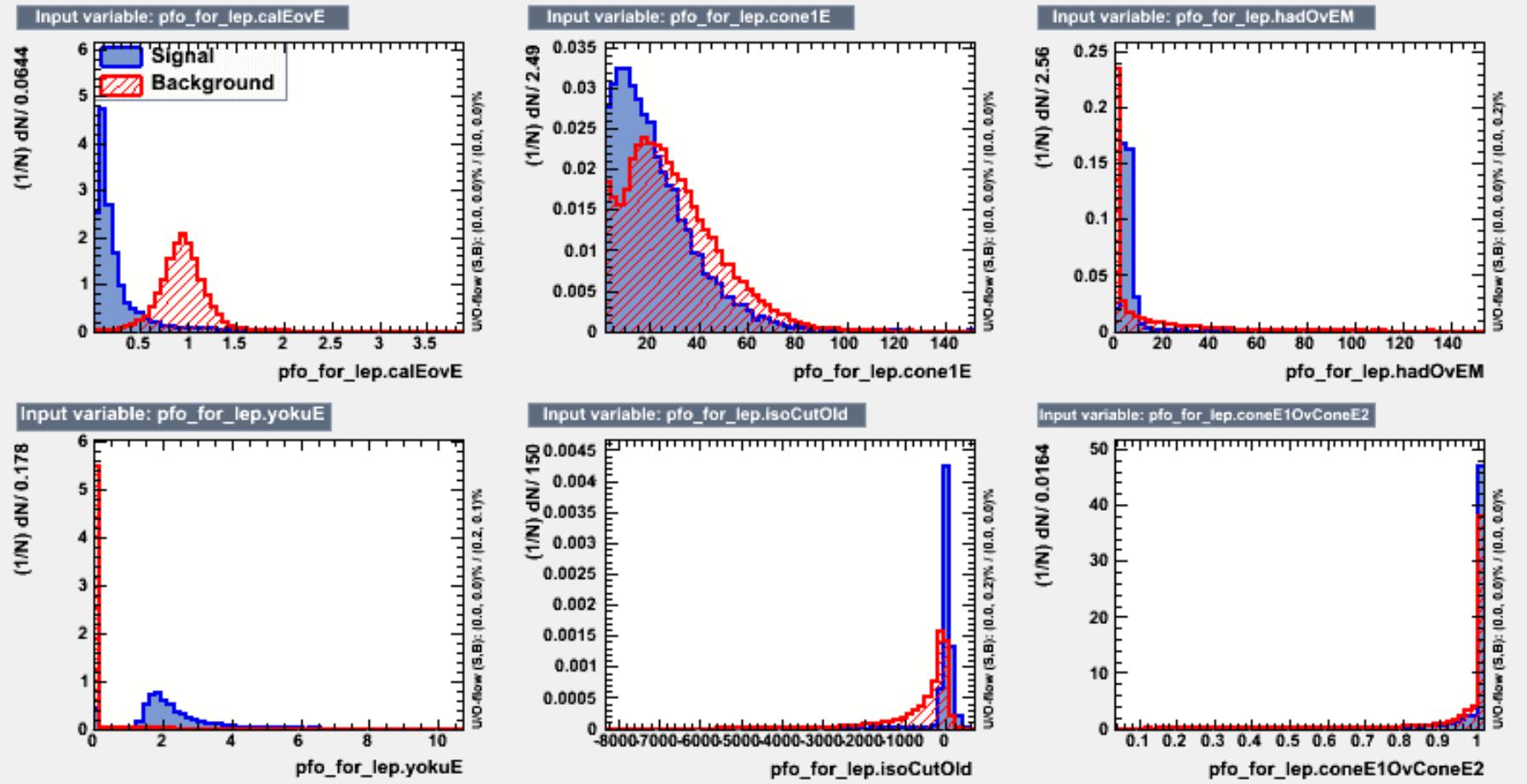


$\tau(h)$

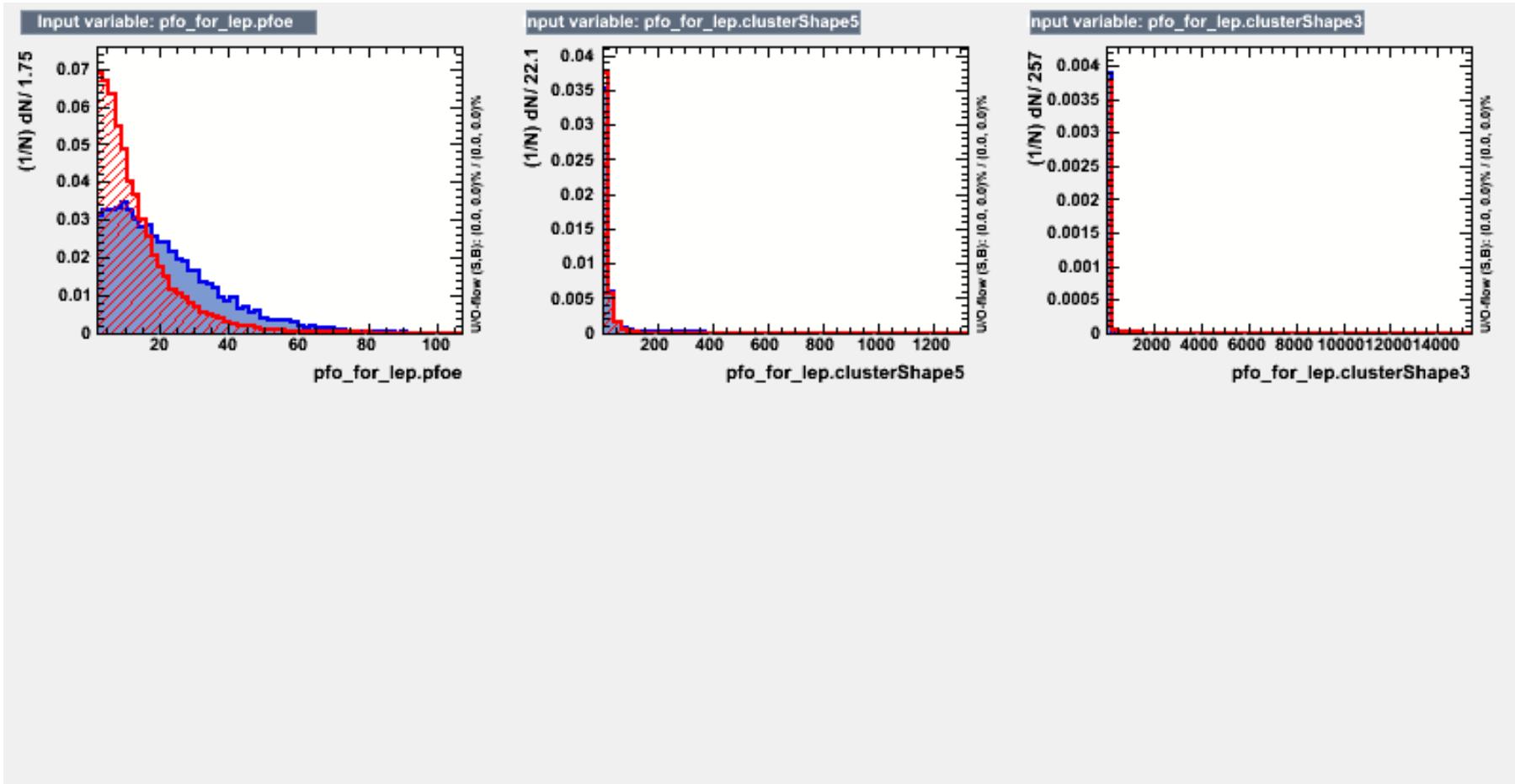
Correlation Matrix (background)



BDT input variables taum-tauh 1



BDT input variables taum-tauh 2

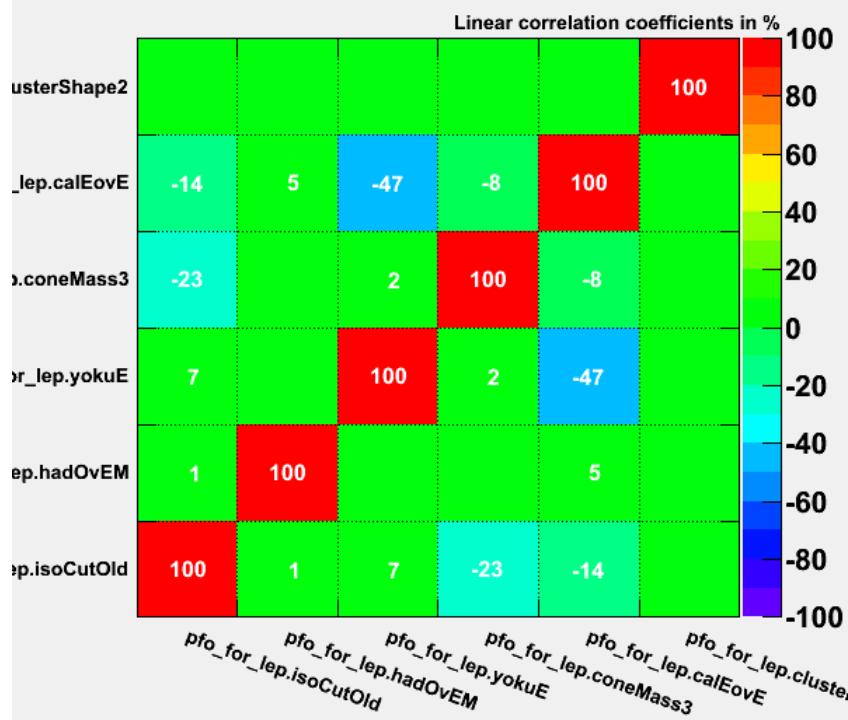


Correlation

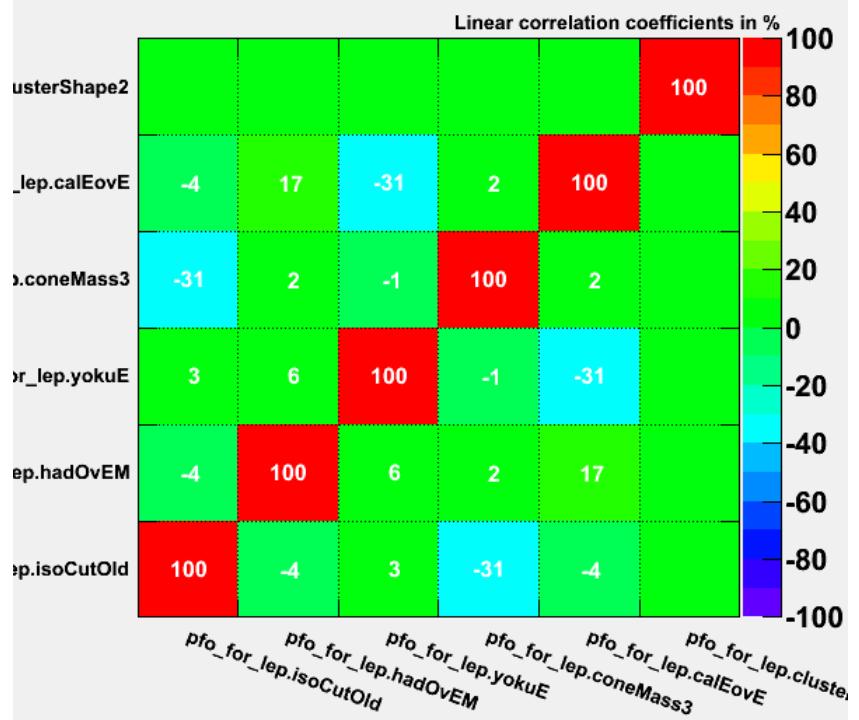
tau(m)

b jet

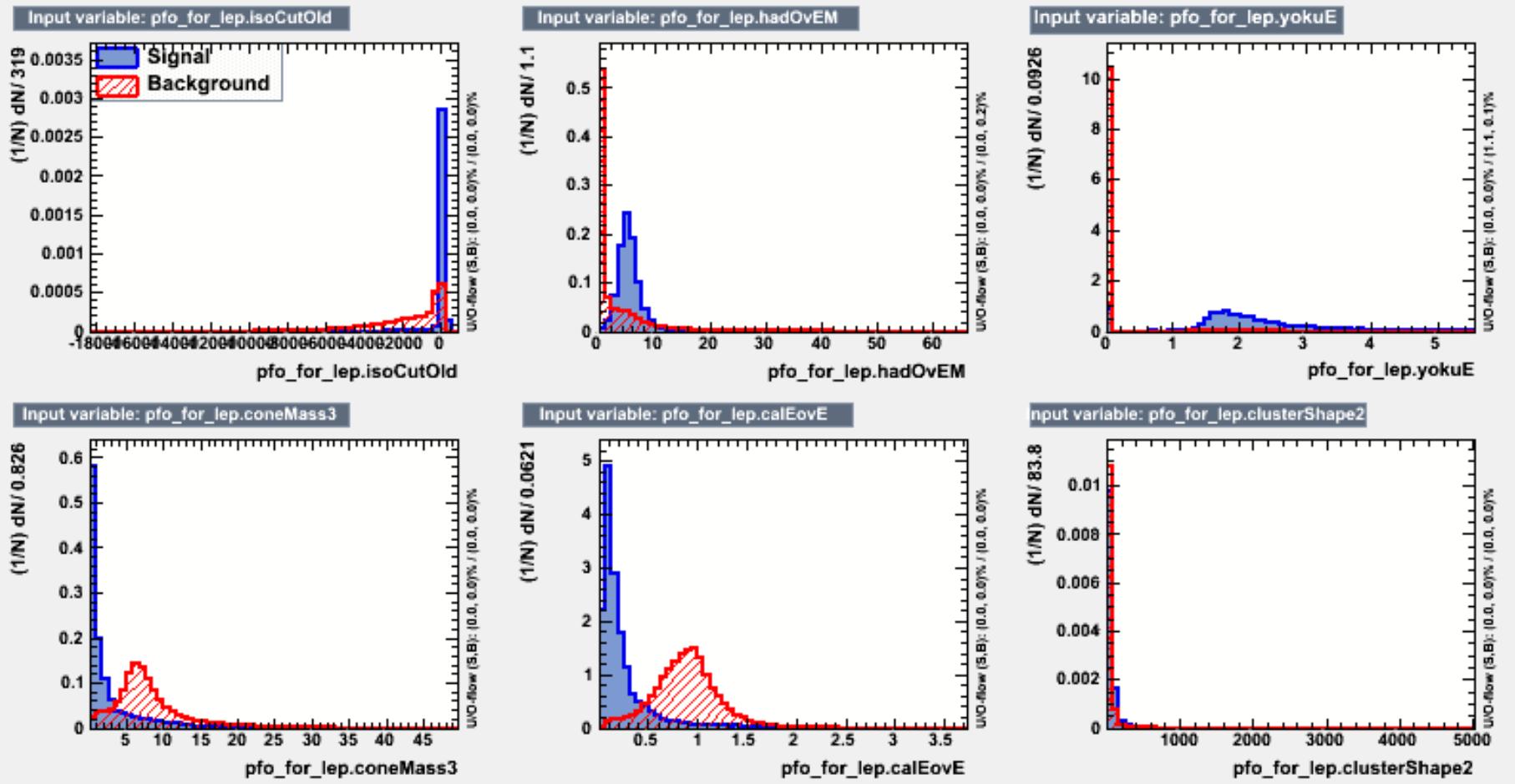
Correlation Matrix (signal)



Correlation Matrix (background)



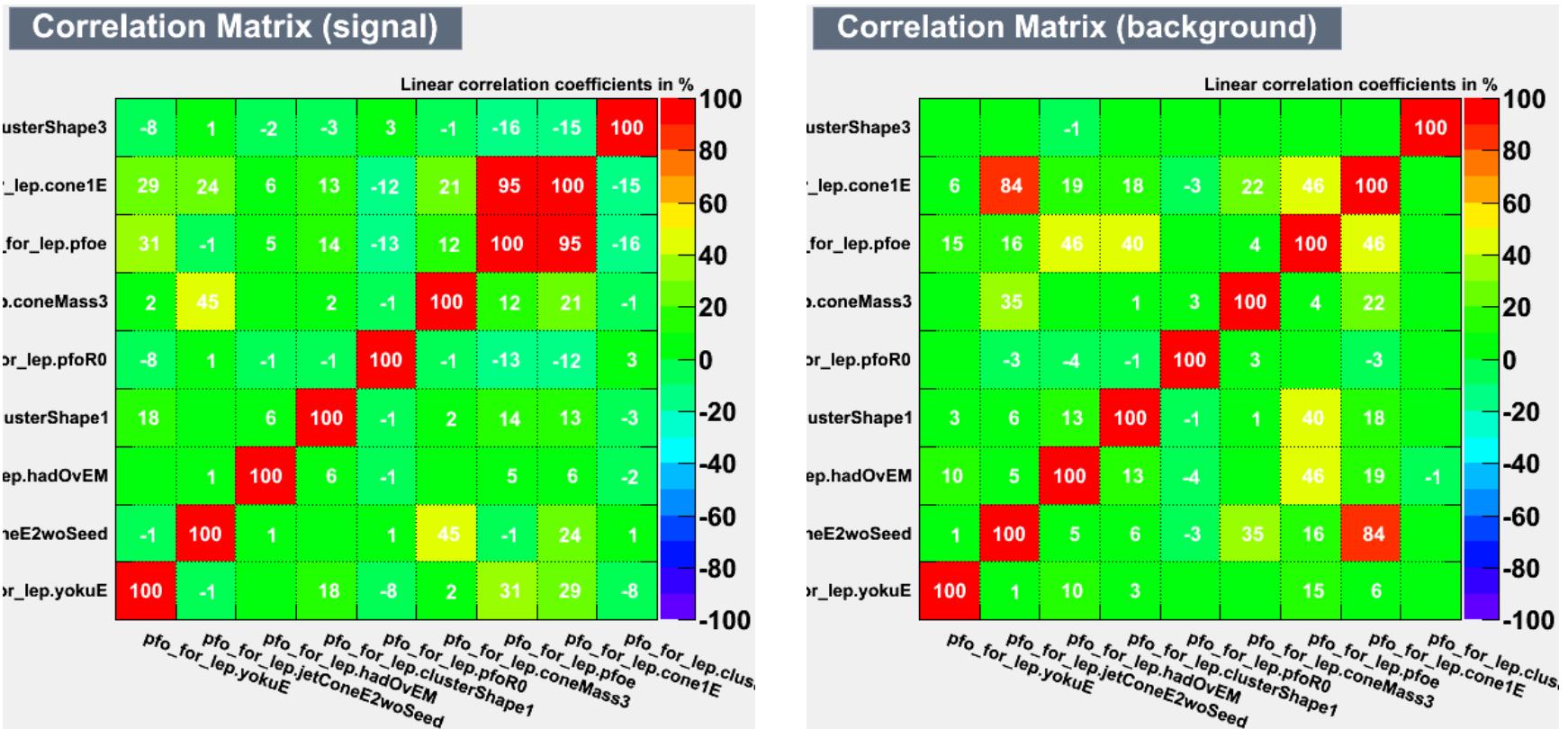
BDT input variables taum-bjet 1



Correlation plots

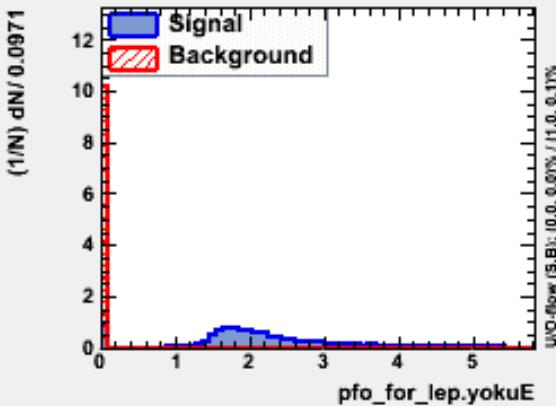
$\tau(m)$

If jet

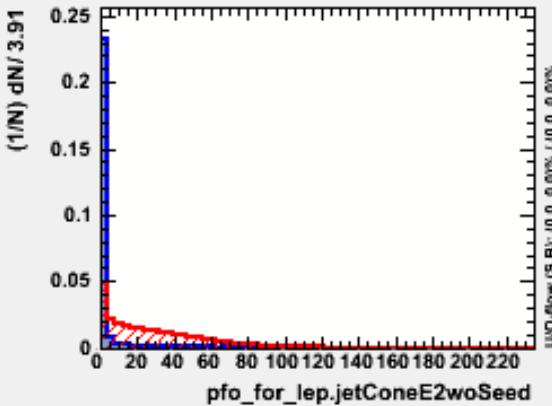


BDT input variables taum-lfjet 1

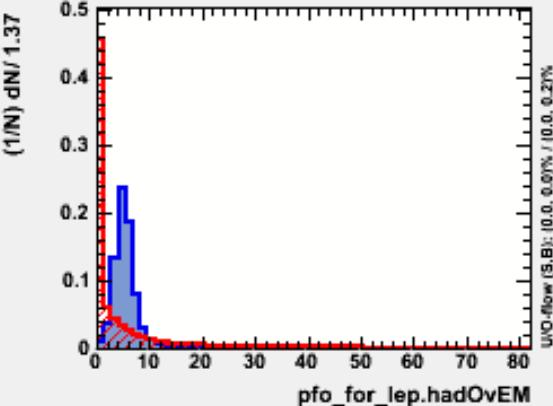
Input variable: pfo_for_lep.yokuE



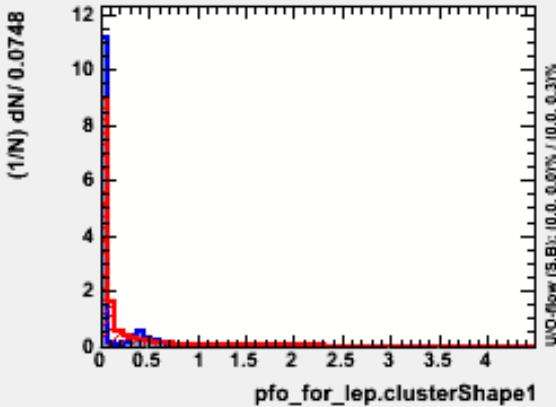
Input variable: pfo_for_lep.jetConeE2woSeed



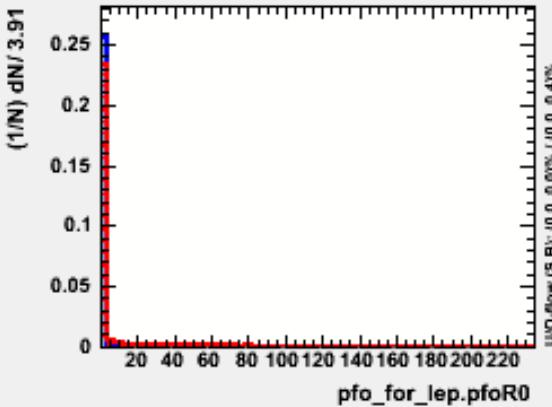
Input variable: pfo_for_lep.hadOvEM



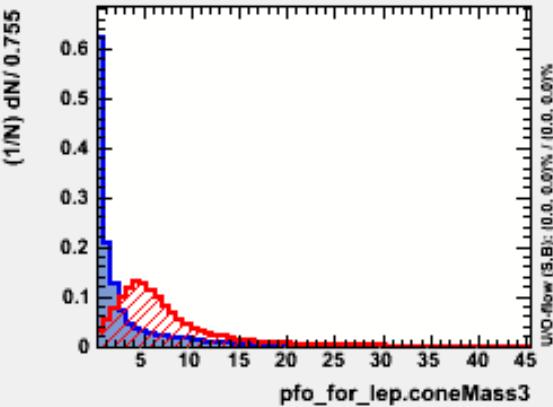
Input variable: pfo_for_lep.clusterShape1



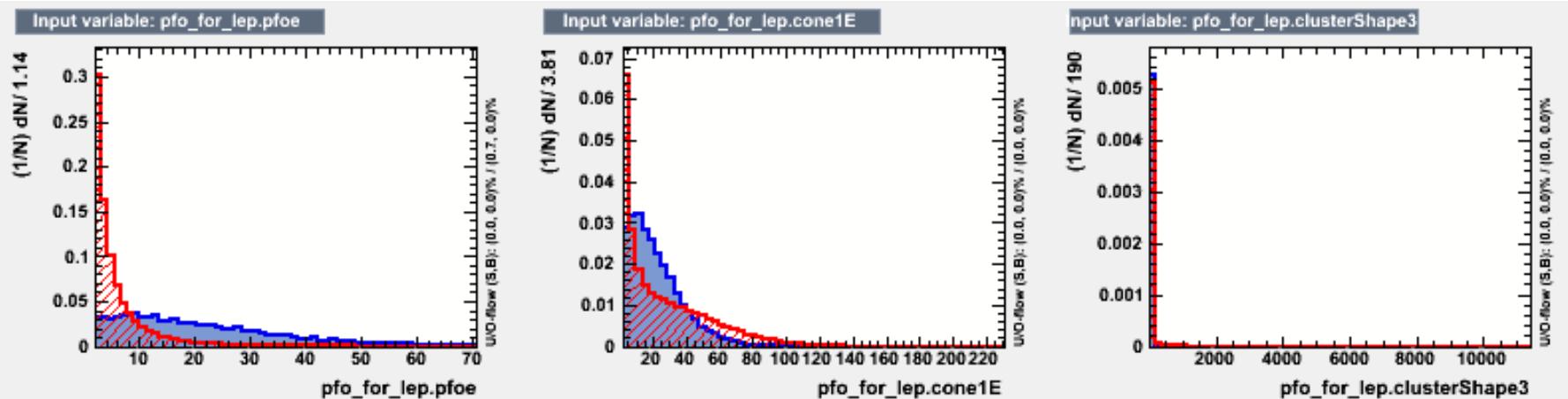
Input variable: pfo_for_lep.pfoR0



Input variable: pfo_for_lep.coneMass3



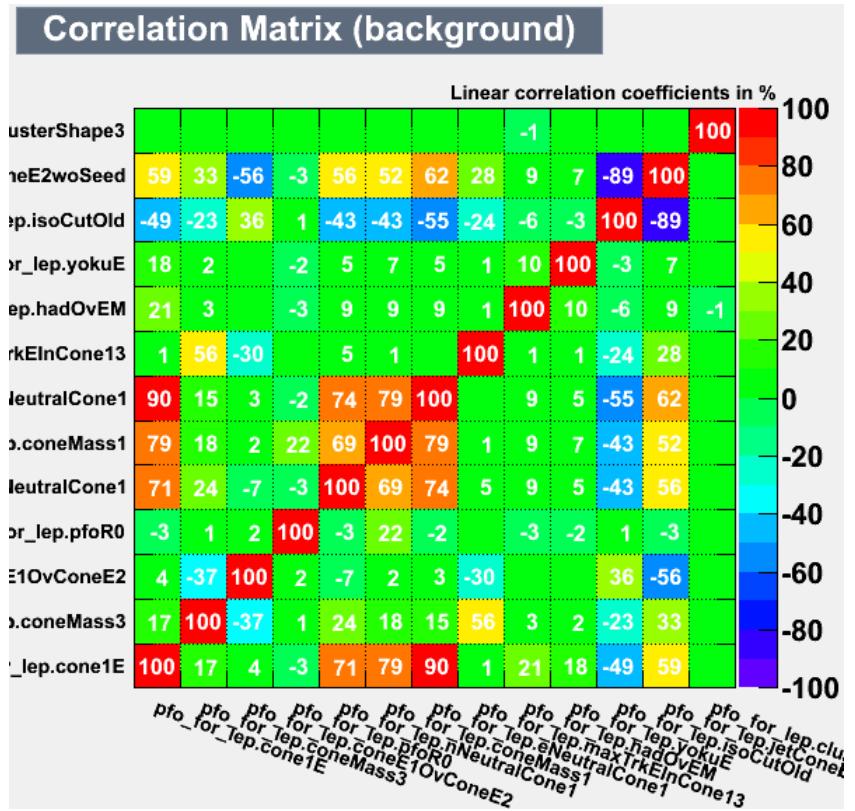
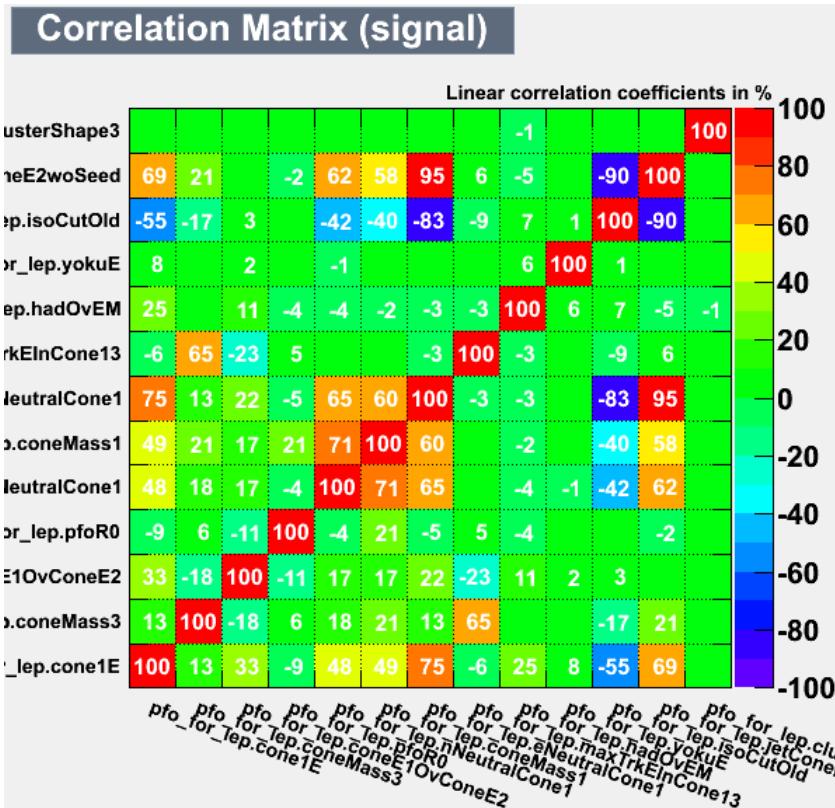
BDT input variables taum-lfjet 2



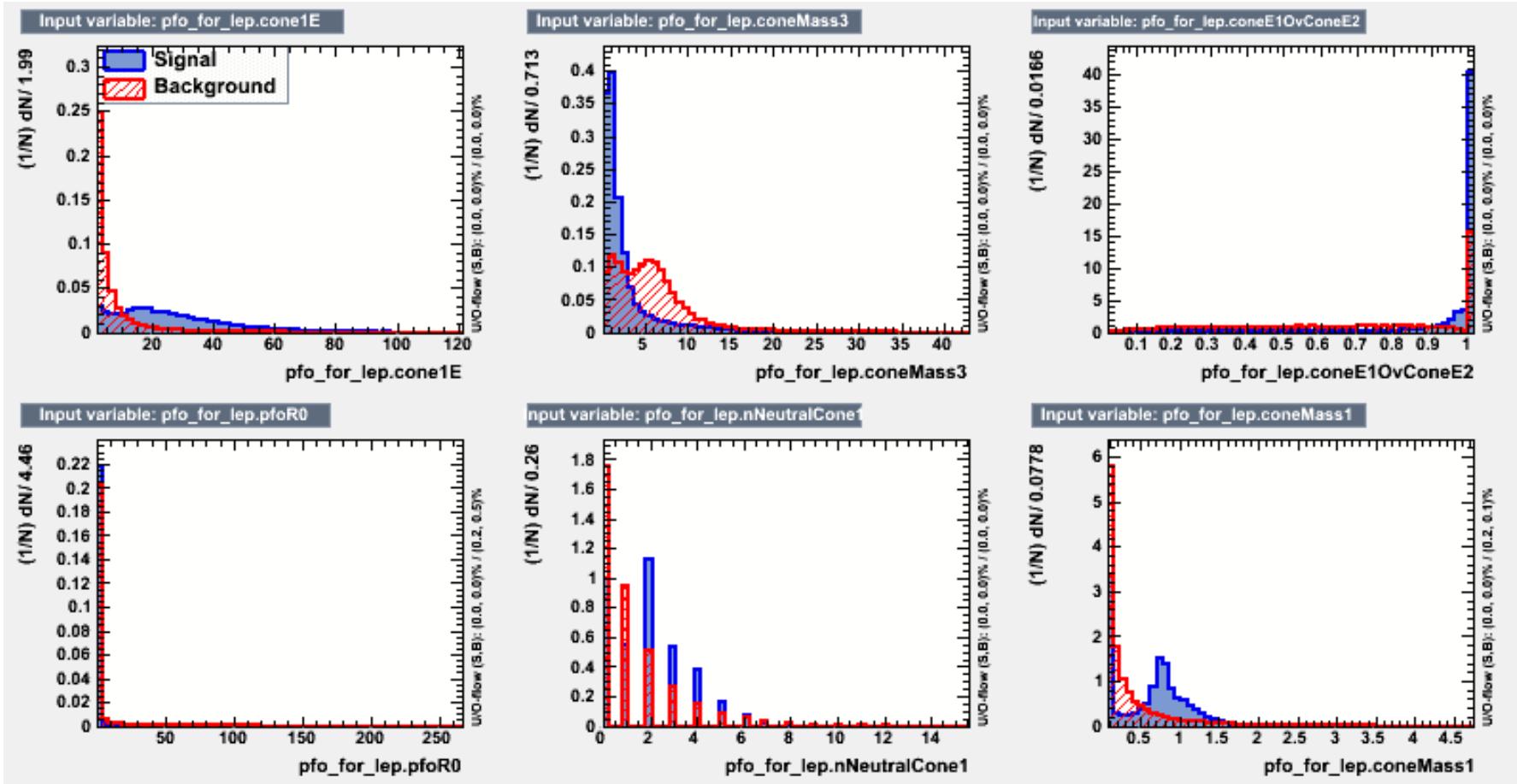
Correlation

tau(1-prong)

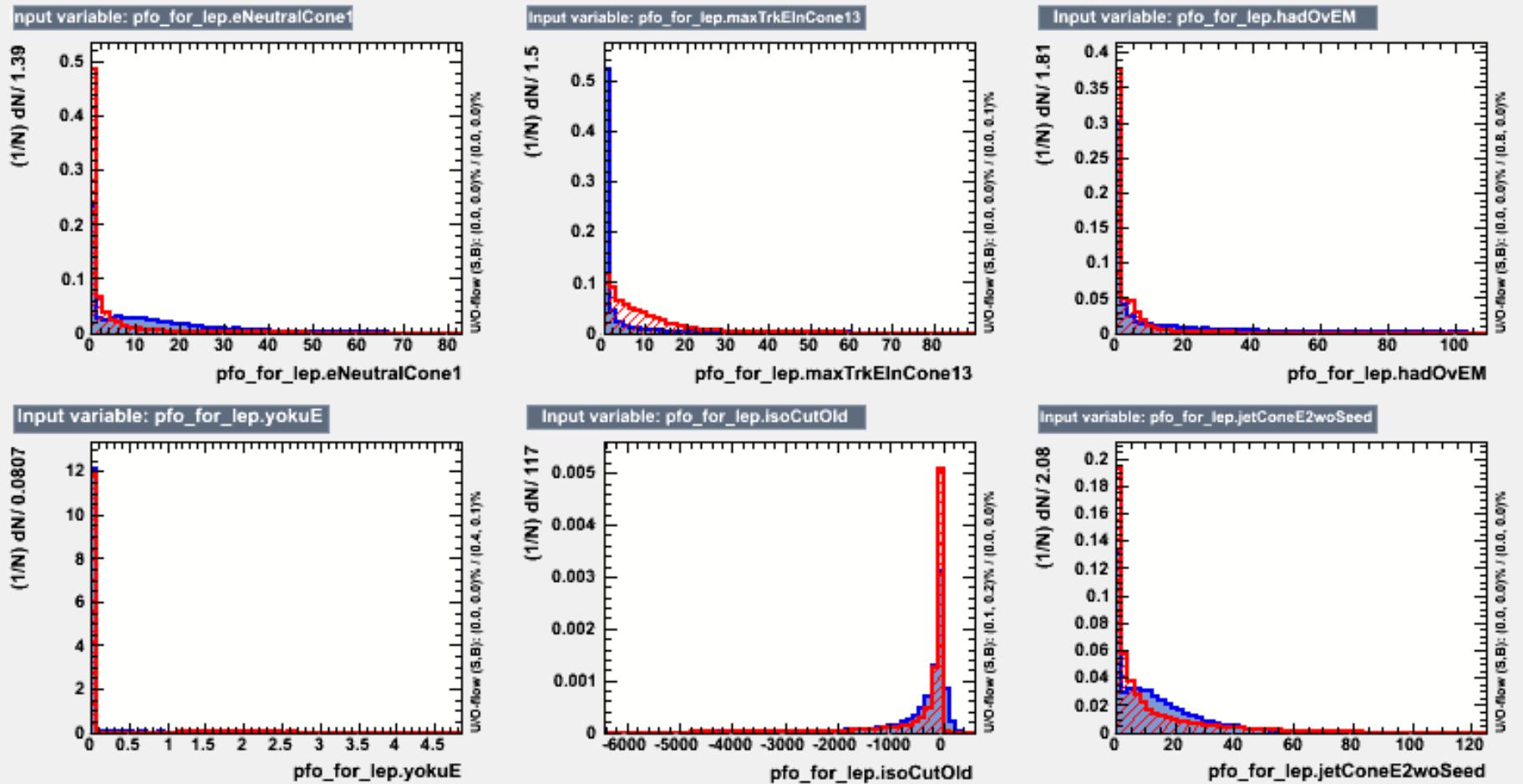
b jet



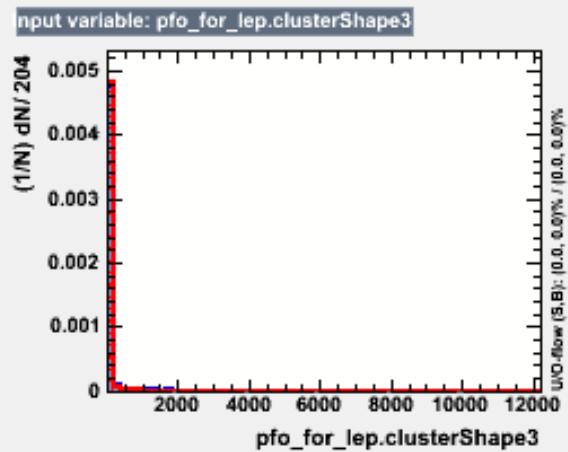
BDT input variables tauh1-bjet 1



BDT input variables tauh1-bjet 2



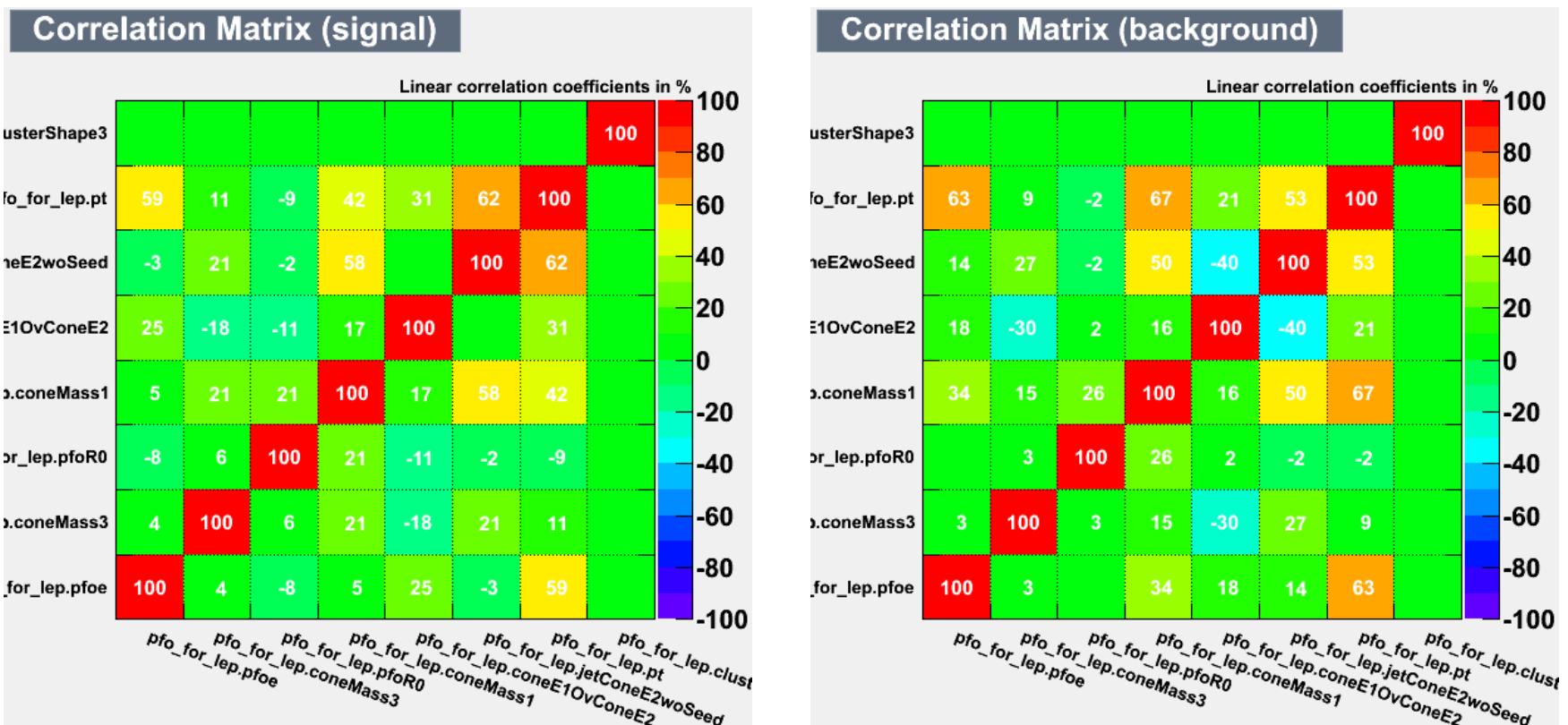
BDT input variables tauh1-bjet 3



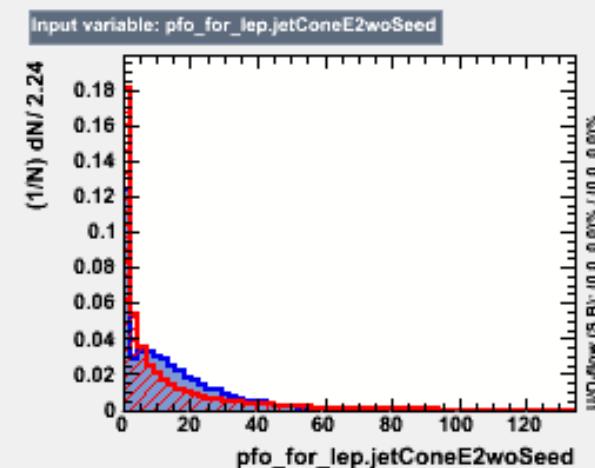
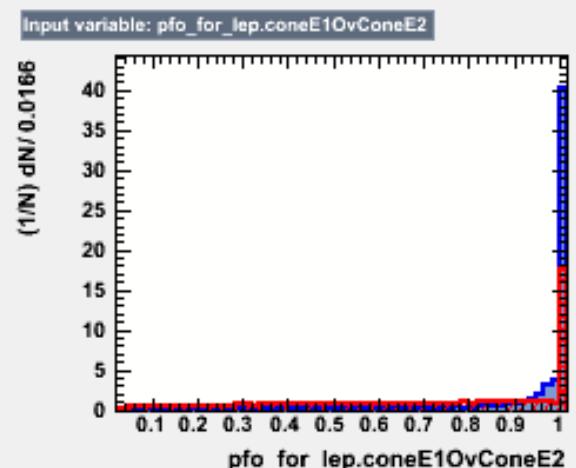
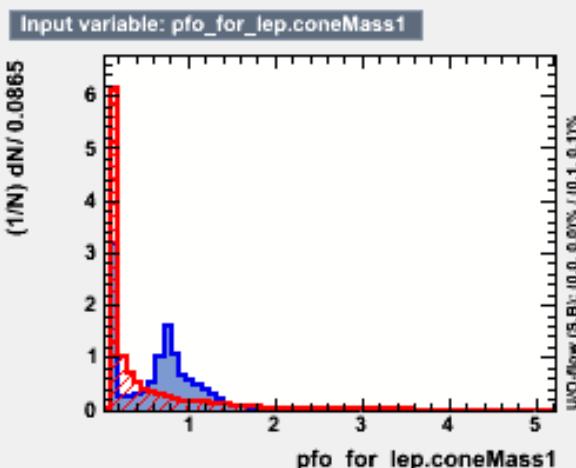
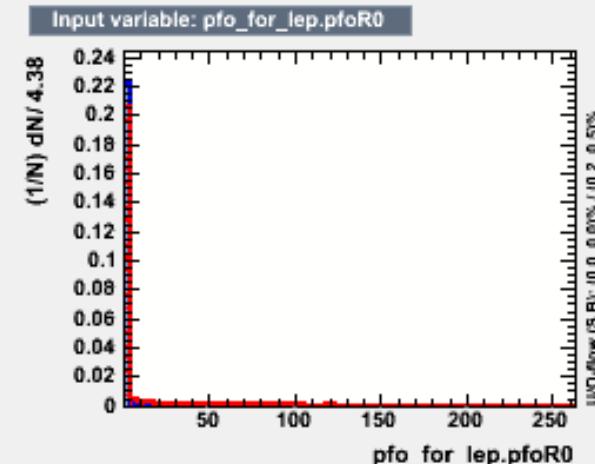
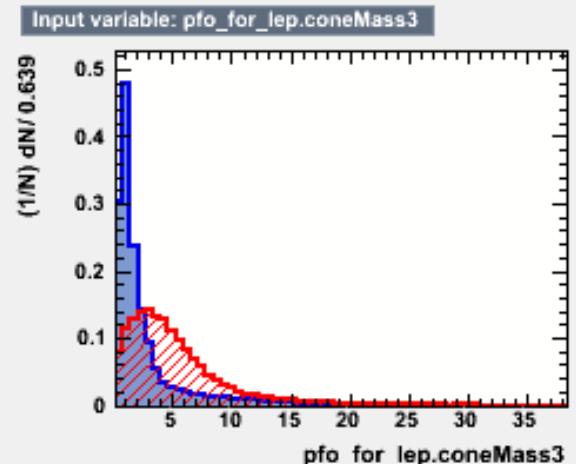
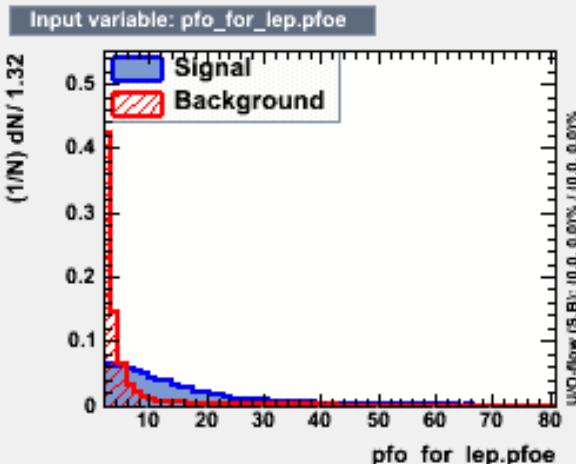
Correlation

tau(1-prong)

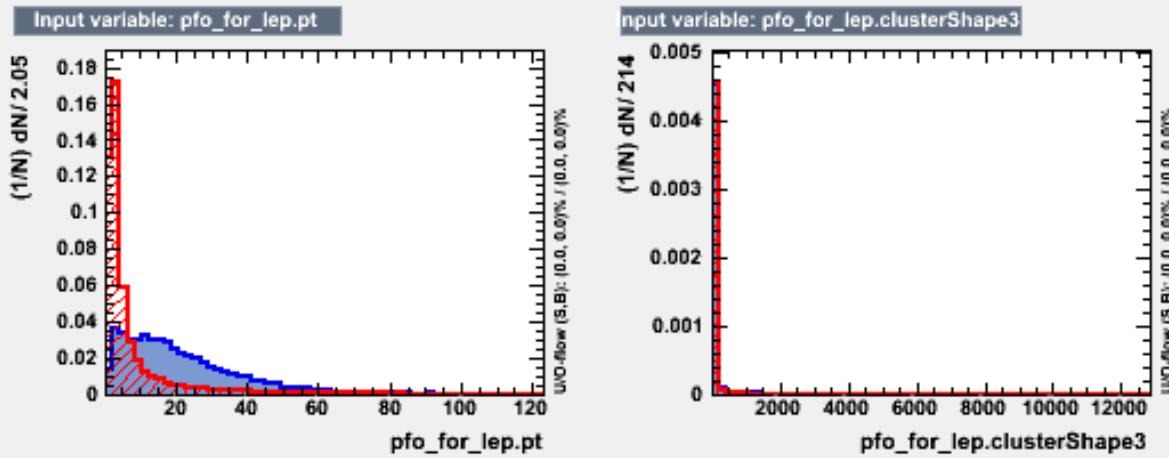
If jet



BDT input variables tauh1-lfjet 1

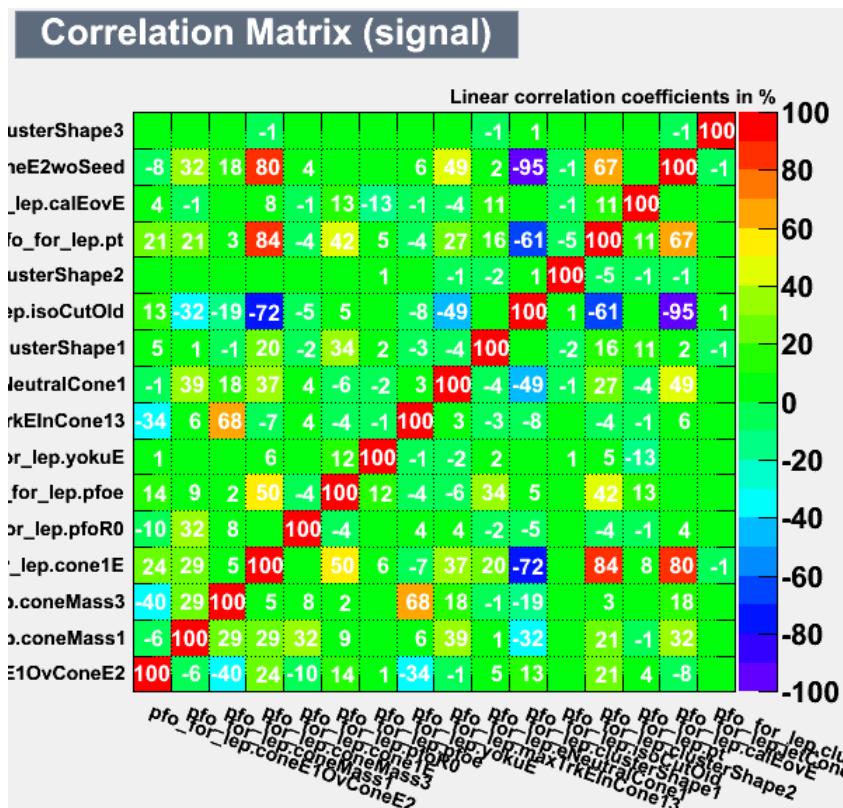


BDT input variables tauh1- 2

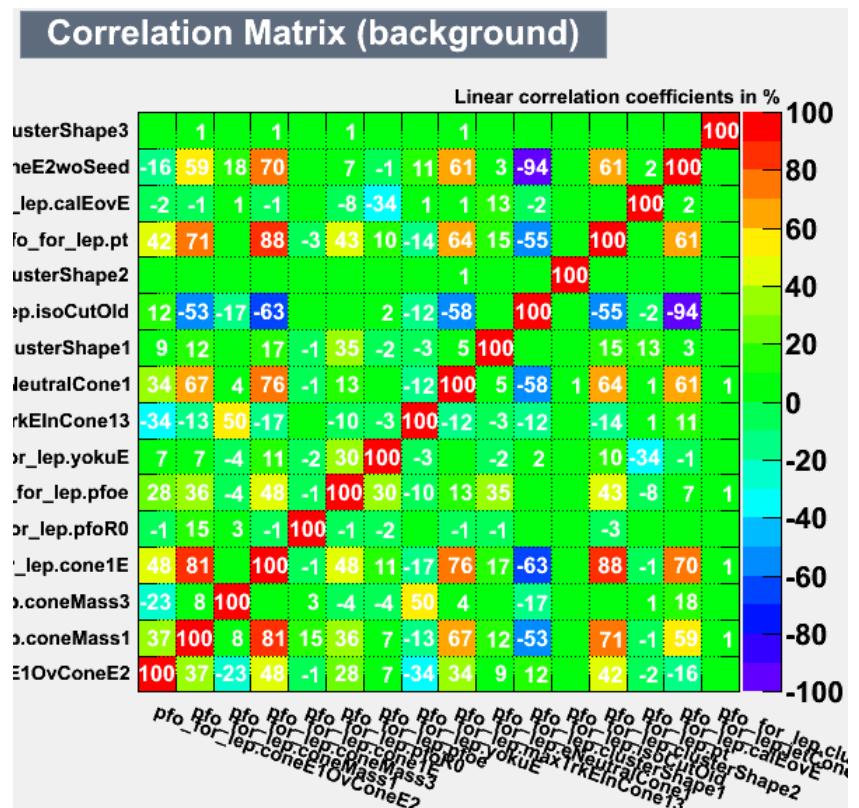


Correlation

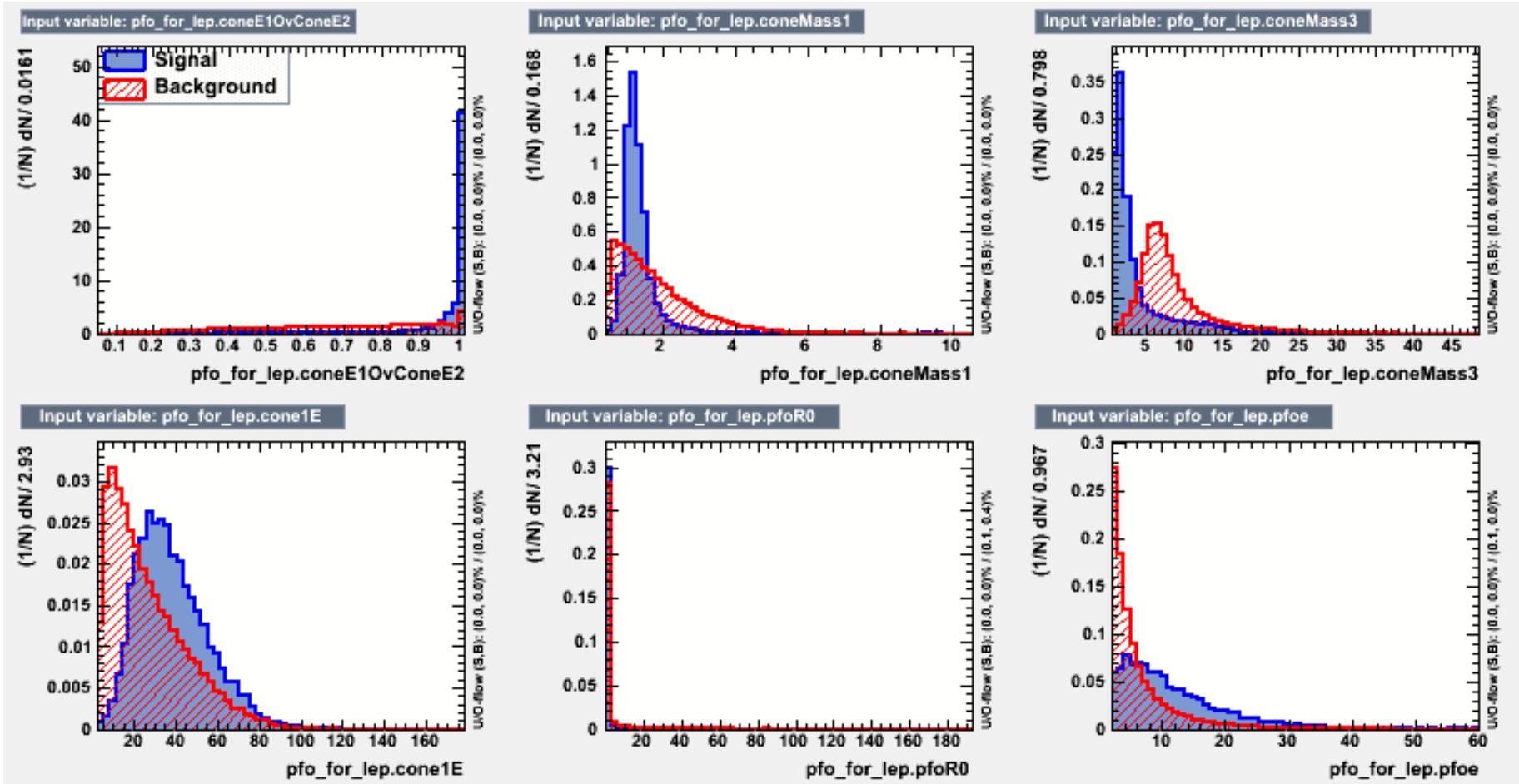
tau(3-prong)



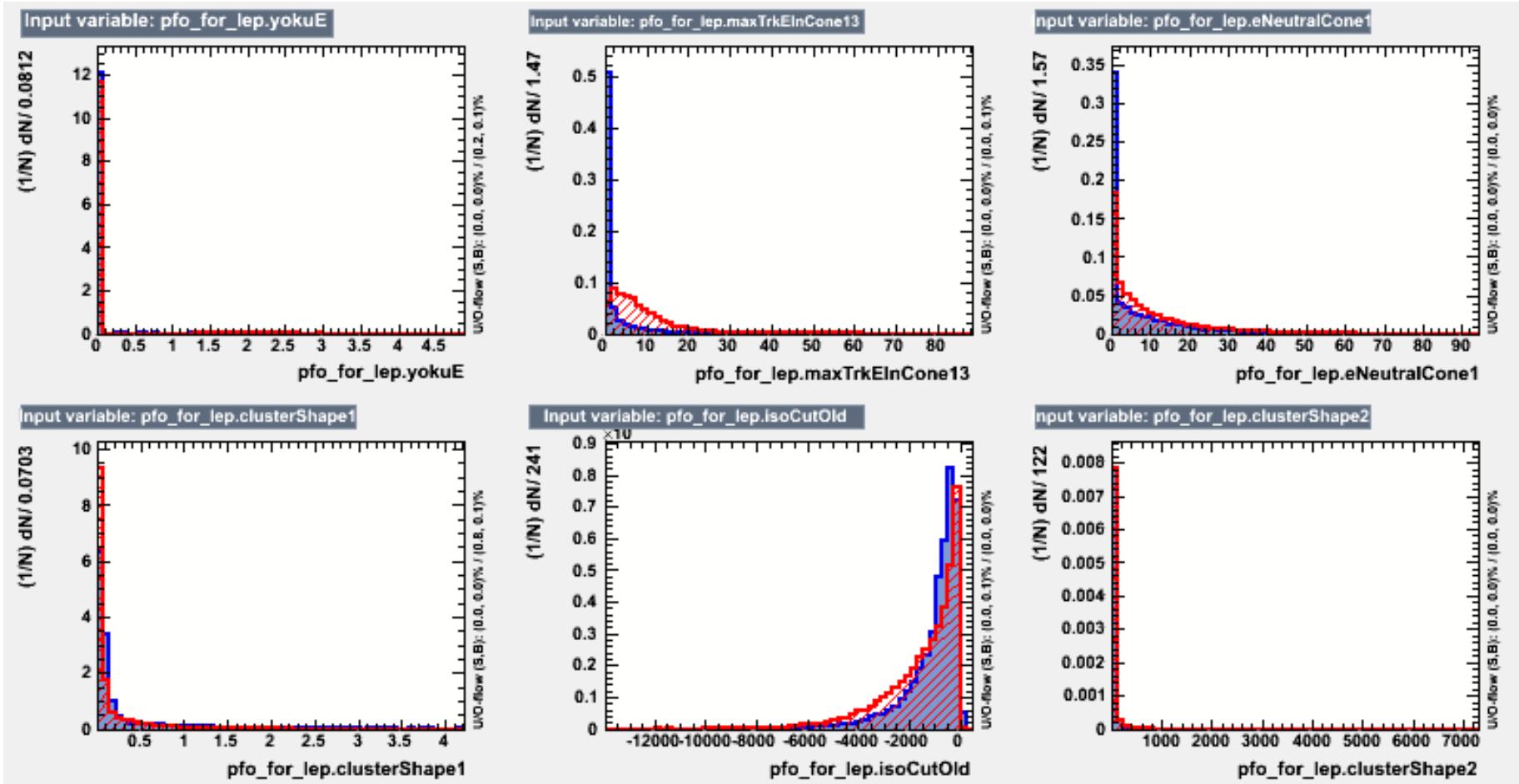
b jet



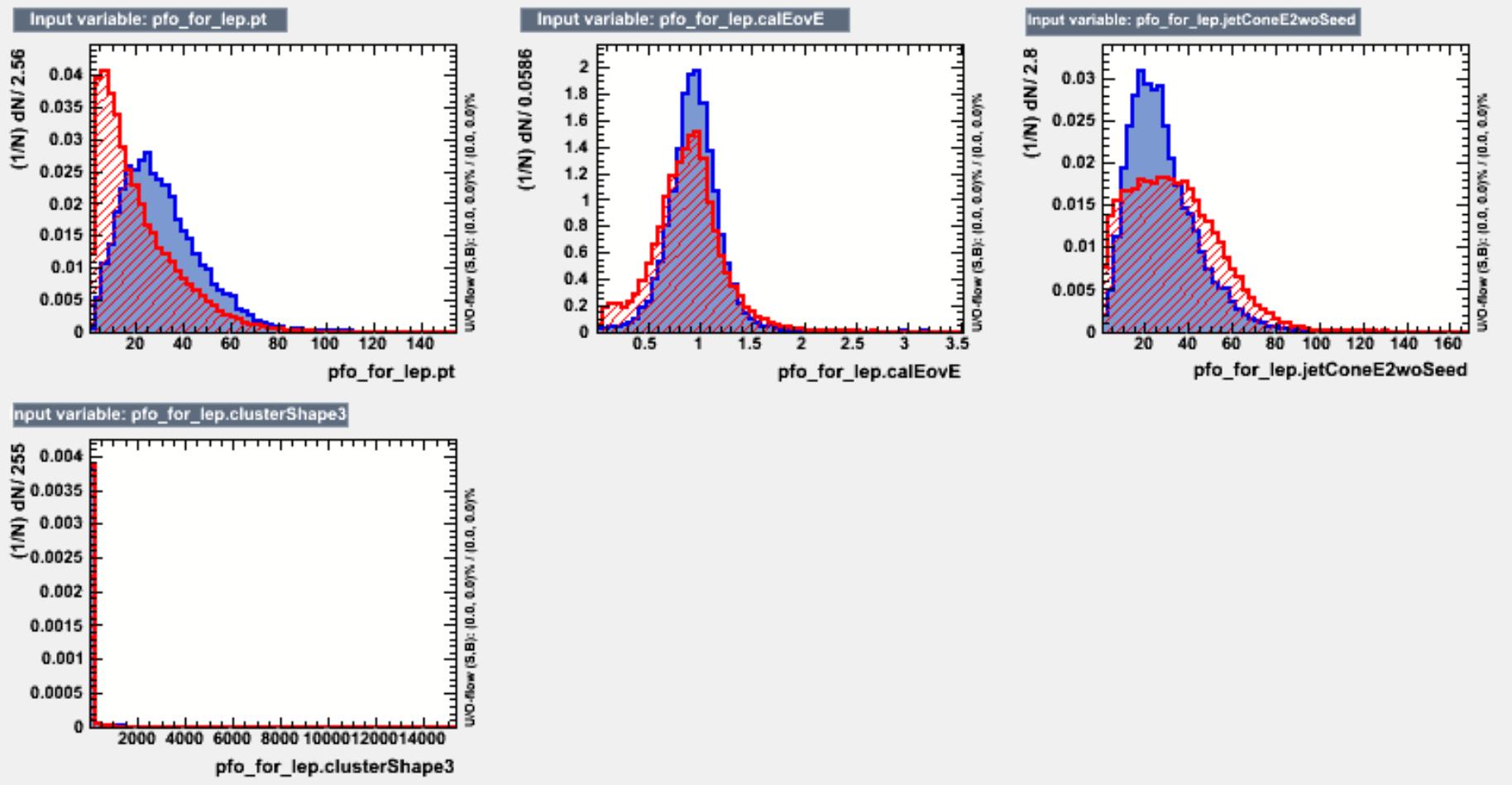
BDT input variables tauh3-bjet 1



BDT input variables tauh3-bjet 2



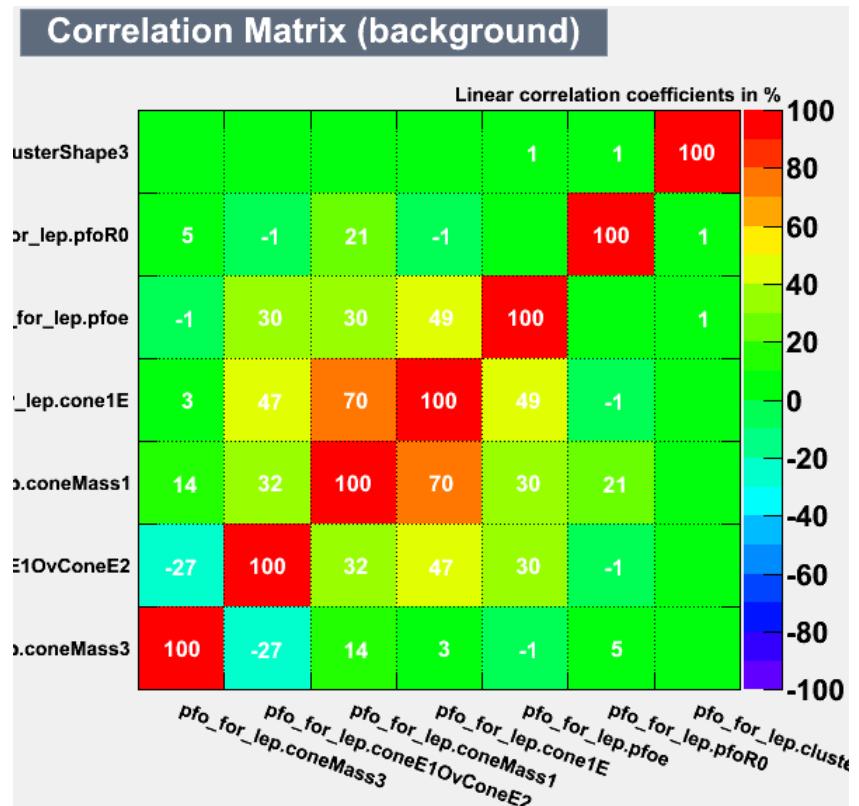
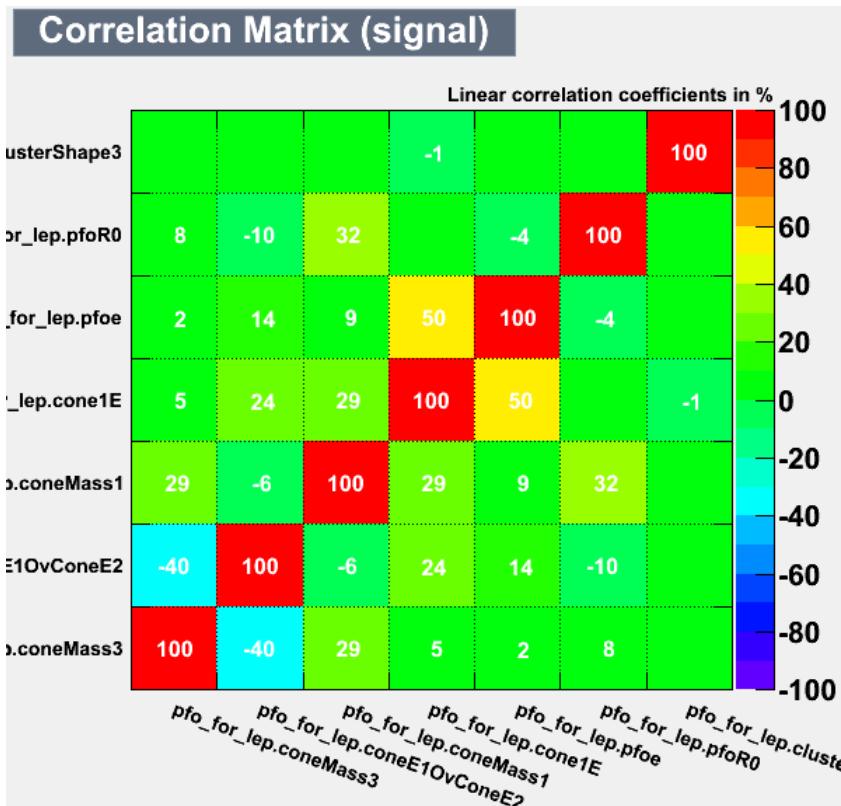
BDT input variables tauh3-bjet 3



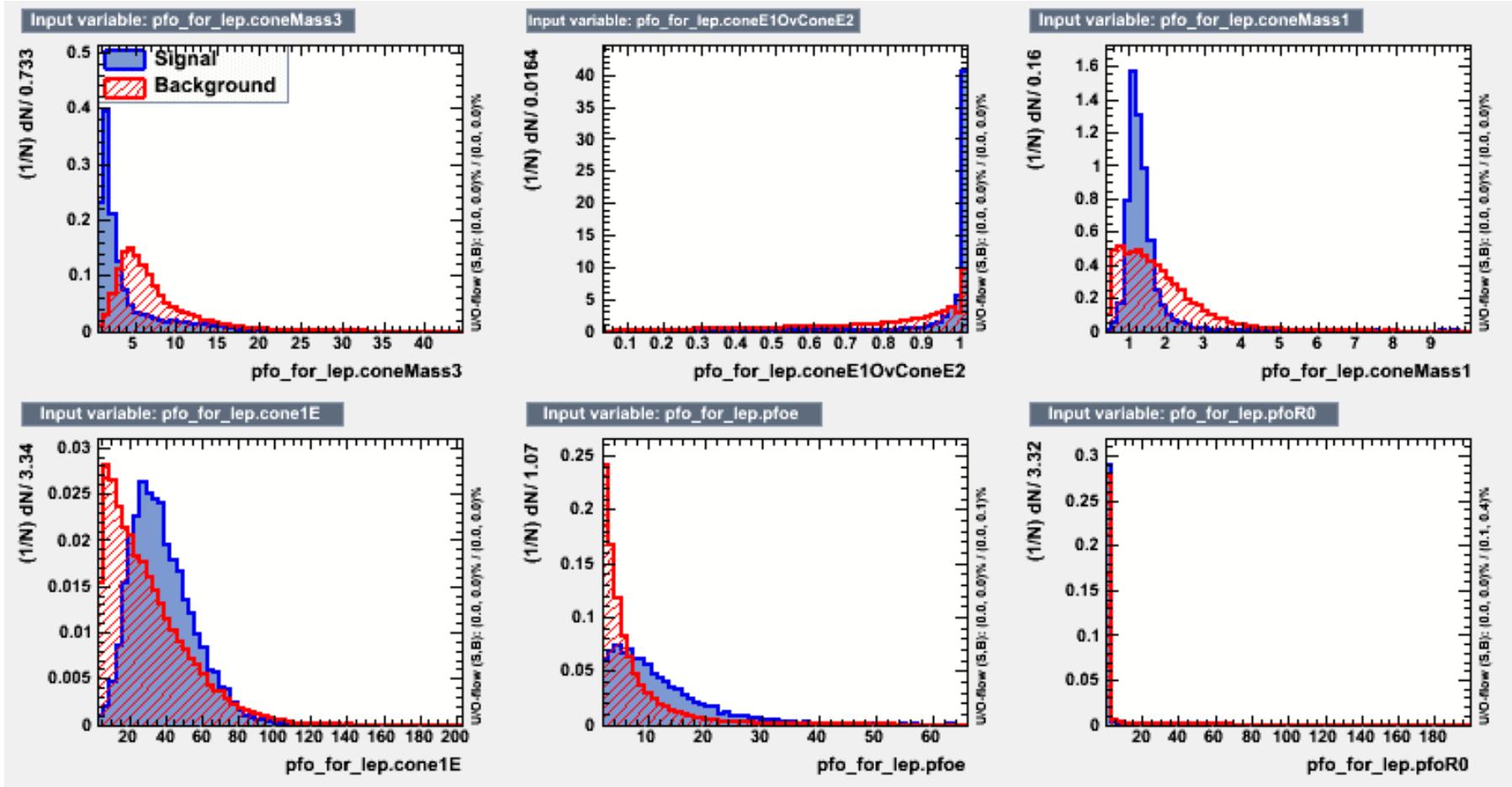
Correlation

tau(3-prong)

If jet



BDT input variables tauh3-lfjet 1



BDT input variables tauh3-lfjet 2

Input variable: pfo_for_lep.clusterShape3

