

Progress Update

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Cut Optimization: Grid Search

- Cut optimization against FOM using N-dimensional grid search
 - Example shown uses 11 grid points per cut (+1 point for case where cut is not used)
 - 1.5 GeV cut included in baseline
- 2Reπ** (7 variables)
- $p_e - p_\pi$ low (-1000,-500)
 - $p_e - p_\pi$ high (500,1000)
 - p_{low} (20,70)
 - $m_{e\pi}$: (200,300) low, (310,410) high
vs
 $nll_{2Re\pi} - nll_{2Ree}$: (-100,-50) low, (-75,-25) high
- 2Reπ1de** (3 variables)
- $p_e - p_\pi$ low (-1000,-500)
 - $p_e - p_\pi$ high (500,1000)
 - $d2se$ (150,200)

Grid Search Summary

BL+E_{rec}: 0.638

2Reπ
Max: (0,5,6,7,6,8,0)
Max FOM = 0.697
p_e-p_{π} low not used
p_e-p_{π} high = 700
p_{low} = 45
m_{eπ} low = 260
m_{eπ} high = 360
nll_{2Reπ}-nll_{2Ree} low = -65
nll_{2Reπ}-nll_{2Ree} high not used

2Reπ1de
Max: (10,8,4)
Max FOM = 1.149
p_e-p_{π} low = -550
p_e-p_{π} high = 850
d2se = 180

BL+E_{rec}: 1.124

Grid Search Cutflow

(neutrino beam mode, normal mass hierarchy, $\delta_{CP}=0$, 10^{21} POT)

Sample	cut	v_μ/\bar{v}_μ CC	v_e/\bar{v}_e CC	$\text{osc } v_e/\bar{v}_e$ CC	v_μ/\bar{v}_μ NC	v_e/\bar{v}_e NC	Signal	Background	Purity	FOM
2Reπ	baseline+ E_{rec}	0.21	0.55	1.31	2.00	0.13	1.31	2.89	0.31	0.638
	$p_e - p_\pi < 700 \text{ MeV}$	0.21	0.55	1.31	1.99	0.13	1.31	2.87	0.31	0.639
	$p_{\text{low}} > 45 \text{ MeV}$	0.18	0.54	1.29	1.53	0.08	1.29	2.33	0.36	0.677
	$m_{e\pi} < 260 \text{ MeV}$ $> 360 \text{ MeV} \parallel$ $nL_{2\text{Re}\pi} - nL_{2\text{Re}e} < -65$	0.17	0.53	1.25	1.21	0.06	1.25	1.98	0.39	0.697
2Reπ1de	baseline+ E_{rec}	0.71	0.85	2.58	1.04	0.09	2.58	2.70	0.49	1.124
	$-550 < p_e - p_\pi < 850$	0.67	0.84	2.55	0.91	0.08	2.55	2.49	0.51	1.135
	$d2se < 180$	0.53	0.80	2.50	0.83	0.07	2.50	2.23	0.53	1.149

Event breakdown: 2Re π

(neutrino beam mode, normal mass hierarchy, $\delta_{CP}=0$, 10^{21} POT)

cut	v_e/\bar{v}_e NC 1 π^+	v_e/\bar{v}_e NC 1 π^-	v_e/\bar{v}_e NC 1 π^0	v_e/\bar{v}_e NC N π	v_e/\bar{v}_e NC 0 π	v_μ/\bar{v}_μ NC 1 π^+	v_μ/\bar{v}_μ NC 1 π^-	v_μ/\bar{v}_μ NC 1 π^0	v_μ/\bar{v}_μ NC N π	v_μ/\bar{v}_μ NC 0 π
baseline+E _{rec}	0.02	0.03	0.04	0.01	0.04	0.21	0.28	0.89	0.18	0.44
p _e -p _{π} <700MeV	0.02	0.03	0.04	0.01	0.04	0.21	0.28	0.89	0.17	0.44
p _{low} >45MeV	0.01	0.01	0.04	0.01	0.01	0.13	0.15	0.89	0.16	0.20
m _{$_{en}$} <260MeV >360MeV n _{l_{2Reπ}} - nll _{2Reπ} <-65	0.01	0.01	0.02	0.01	0.01	0.13	0.14	0.62	0.15	0.17

cut	v_e/\bar{v}_e CC1 $\pi^{+/-}$	v_e/\bar{v}_e CCQE	v_e/\bar{v}_e CCother	v_μ/\bar{v}_μ CC1 $\pi^{+/-}$	v_μ/\bar{v}_μ CCQE	v_μ/\bar{v}_μ CCother	v_e/\bar{v}_e CC1 $\pi^{+/-}$	Other	Purity
baseline+E _{rec}	1.27	0.38	0.22	0.06	0.05	0.10	1.27	2.93	0.30
p _e -p _{π} <700MeV	1.26	0.38	0.21	0.06	0.05	0.09	1.26	2.92	0.30
p _{low} >45MeV	1.24	0.37	0.21	0.05	0.04	0.09	1.24	2.38	0.34
m _{$_{en}$} <260MeV >360MeV n _{l_{2Reπ}} - nll _{2Reπ} <-65	1.23	0.36	0.20	0.05	0.04	0.09	1.23	2.01	0.38

Event breakdown: 2Re π 1de

(neutrino beam mode, normal mass hierarchy, $\delta_{CP}=0$, 10^{21} POT)

cut	v_e/\bar{v}_e NC $1\pi^+$	v_e/\bar{v}_e NC $1\pi^-$	v_e/\bar{v}_e NC $1\pi^0$	v_e/\bar{v}_e NC $N\pi$	v_e/\bar{v}_e NC 0π	v_μ/\bar{v}_μ NC $1\pi^+$	v_μ/\bar{v}_μ NC $1\pi^-$	v_μ/\bar{v}_μ NC $1\pi^0$	v_μ/\bar{v}_μ NC $N\pi$	v_μ/\bar{v}_μ NC 0π
baseline+ E_{rec}	0.03	0.01	0.00	0.02	0.03	0.39	0.10	0.05	0.19	0.31
-550< p_e - p_π <850	0.02	0.01	0.00	0.02	0.03	0.32	0.08	0.05	0.17	0.30
d2se<180	0.02	0.01	0.00	0.02	0.03	0.29	0.07	0.05	0.16	0.25

cut	v_e/\bar{v}_e CC1 π^{+-}	v_e/\bar{v}_e CCQE	v_e/\bar{v}_e CCother	v_μ/\bar{v}_μ CC1 π^{+-}	v_μ/\bar{v}_μ CCQE	v_μ/\bar{v}_μ CCother	v_e/\bar{v}_e CC1 π^{+-}	Other	Purity
baseline+ E_{rec}	3.21	0.02	0.20	0.28	0.03	0.40	3.21	2.07	0.61
-550< p_e - p_π <850	3.16	0.02	0.20	0.25	0.03	0.38	3.16	1.88	0.63
d2se<180	3.09	0.02	0.19	0.22	0.02	0.29	3.09	1.64	0.65

Some tweaking + first look at wall

BL+E_{rec}: 0.638

2Re π

Max: (0,0,7,7,7,6,8)

Max FOM = 0.712

wall not used

p_e-p _{π} low not used

p_e-p _{π} high = 800

p_{low} = 50

m_{e π} low = 260

m_{e π} high = 360

nll_{2Re π} -nll_{2Ree} low = -65

BL+E_{rec}: 1.124

2Re π 1de

Max: (4,5,3,3)

Max FOM = 1.196

wall = 30

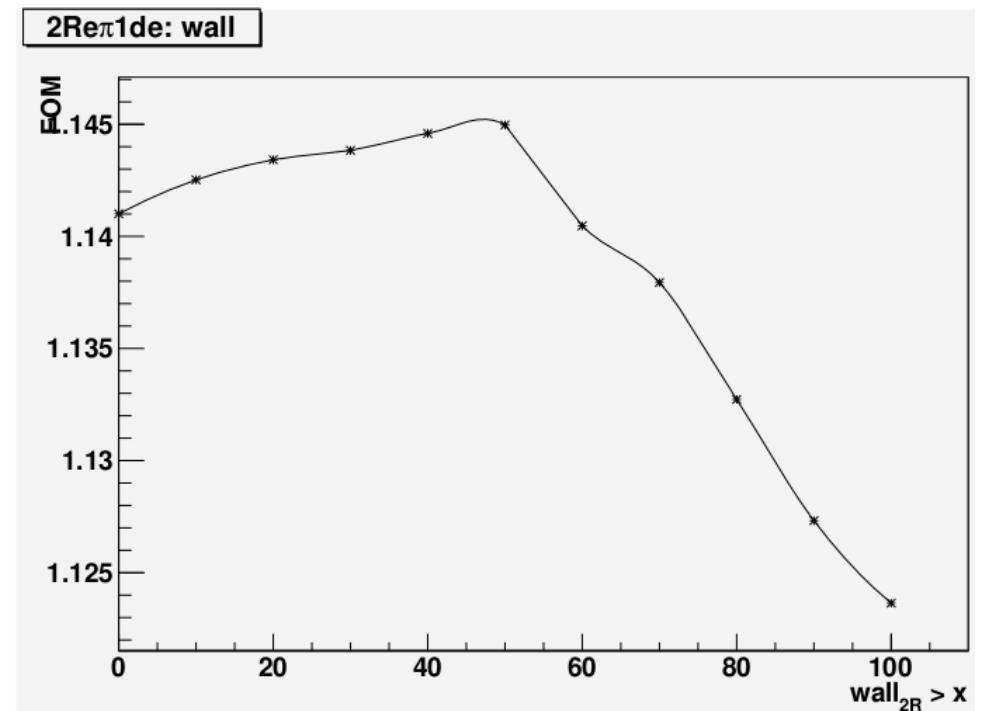
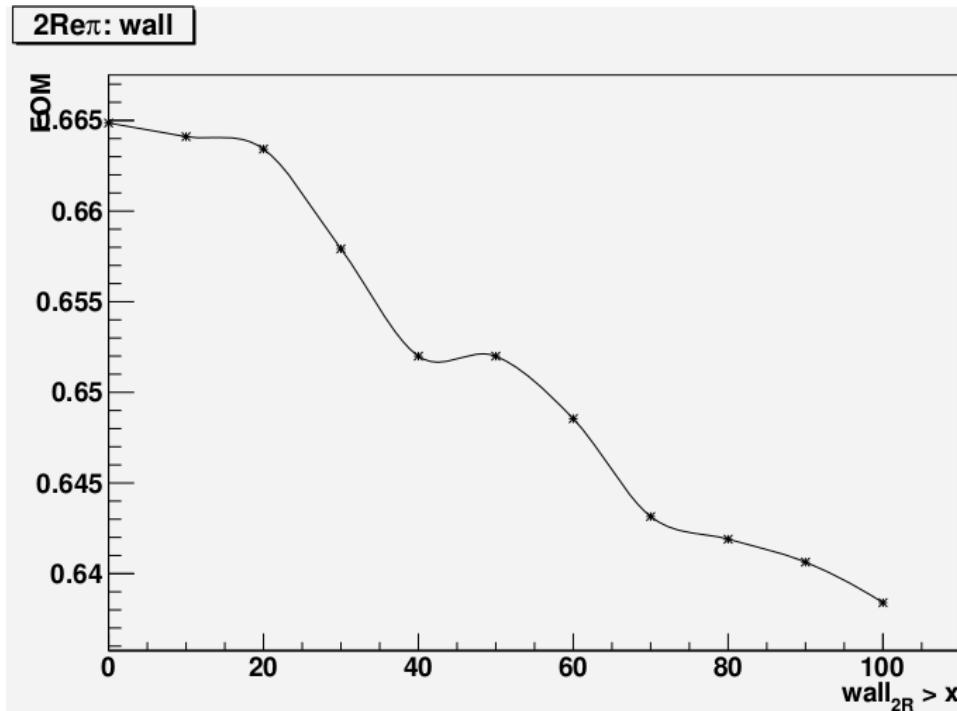
p_e-p _{π} low = -300

p_e-p _{π} high = 350

d2se = 160

wall: (0 cm, 100 cm) in steps of 10 cm

Baseline + Wall cuts



Cutflow

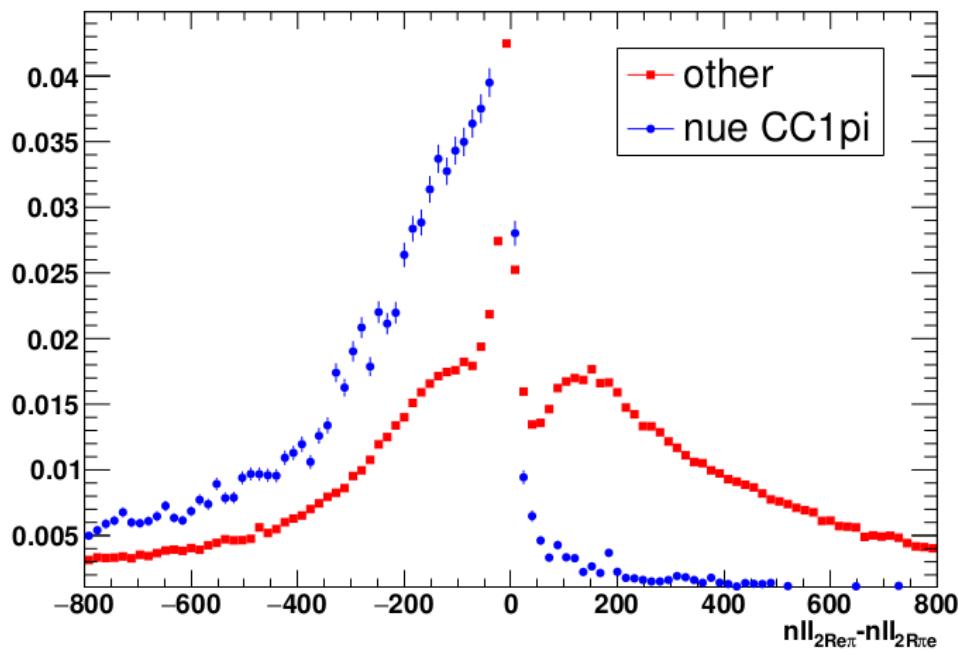
Sample	cut	$\nu_\mu/\bar{\nu}_\mu$ CC	intrinsic $\nu_e/\bar{\nu}_e$ CC	osc $\nu_e/\bar{\nu}_e$ CC	$\nu_\mu/\bar{\nu}_\mu$ NC	$\nu_e/\bar{\nu}_e$ NC	Signal	Background	Purity	FOM
2Reπ	baseline+ E_{rec} (no wall)	0.67	0.71	1.57	2.50	0.15	1.57	4.03	0.28	0.665
	wall>0cm	0.67	0.71	1.57	2.50	0.15	1.57	4.03	0.28	0.665
	$p_e - p_\pi < 800 \text{ MeV}$	0.67	0.70	1.57	2.49	0.15	1.57	4.01	0.28	0.666
	$p_{low} > 45 \text{ MeV}$	0.54	0.69	1.54	1.96	0.10	1.54	3.30	0.32	0.698
	$m_{e\pi} < 260 \text{ MeV}$ $> 360 \text{ MeV} \parallel$ $n l_{2Re\pi} - n l_{2Ree} < -65$	0.50	0.67	1.48	1.58	0.08	1.48	2.84	0.34	0.712
2Reπ1de	baseline+ E_{rec} (no wall)	1.11	0.95	2.84	1.23	0.10	2.84	3.40	0.46	1.137
	wall>30cm	1.00	0.94	2.80	1.16	0.09	2.80	3.19	0.47	1.144
	$-300 < p_e - p_\pi < 350$	0.75	0.74	2.51	0.51	0.05	2.51	2.04	0.55	1.177
	$d2se < 160$	0.57	0.70	2.44	0.42	0.04	2.44	1.72	0.59	1.196

Likelihood Ratios

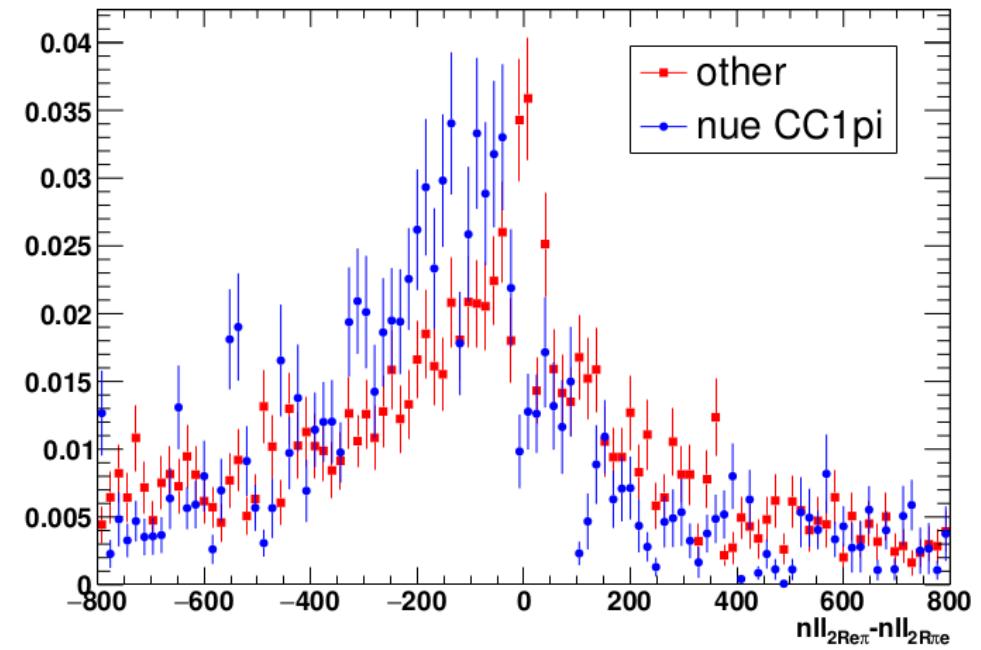
- Look at likelihood ratios of various 2-ring fits both before and after $2R\pi$ -like cut
 - $2R\pi$
 - $2R\pi e$
 - $2Ree$
- Wanted to look at $2Rep$ and $2Rpe$ fits as well, but these all had $nll = 0$
- In following plots, $\nu_e CC1\pi$ is defined by visible particles

$2R\pi$ vs $2R\pi e$

$nll_{2R\pi} - nll_{2R\pi e}$: FCFV

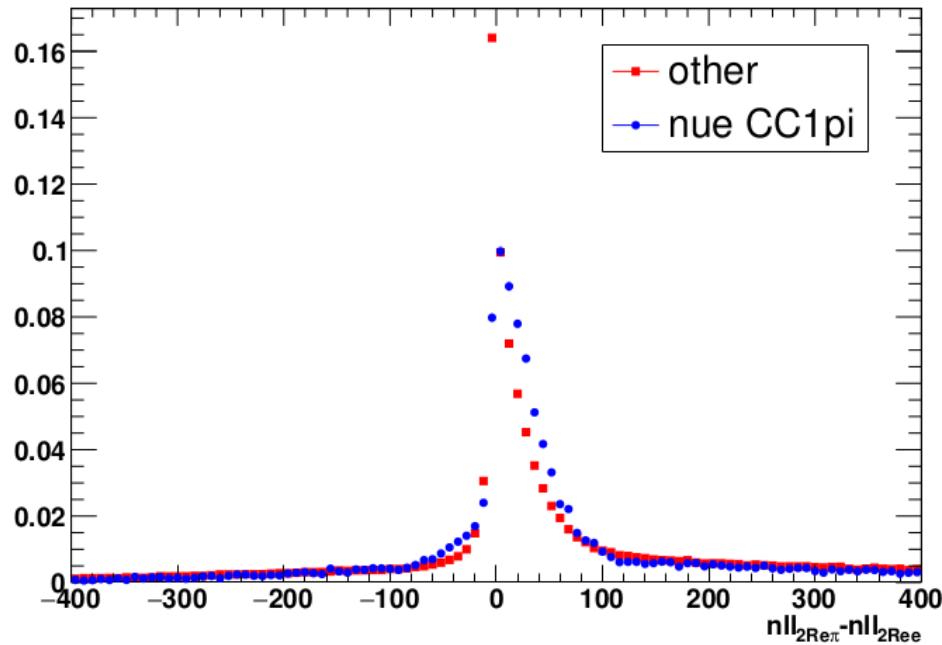


$nll_{2R\pi} - nll_{2R\pi e}$: 2Re π -like

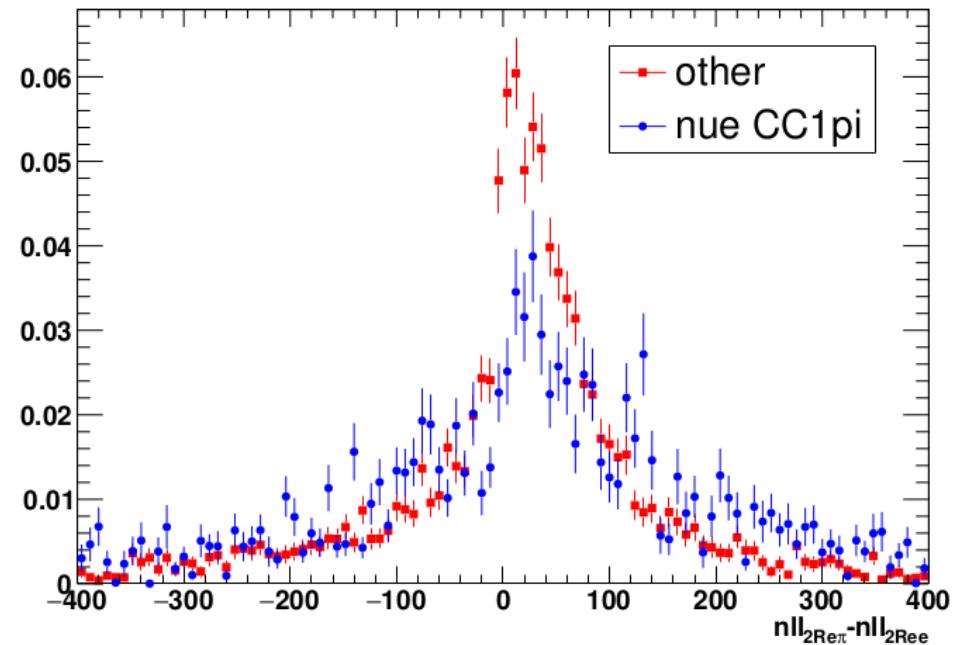


2Re π vs 2Ree

$nll_{2Re\pi} - nll_{2Ree}$: FCFV

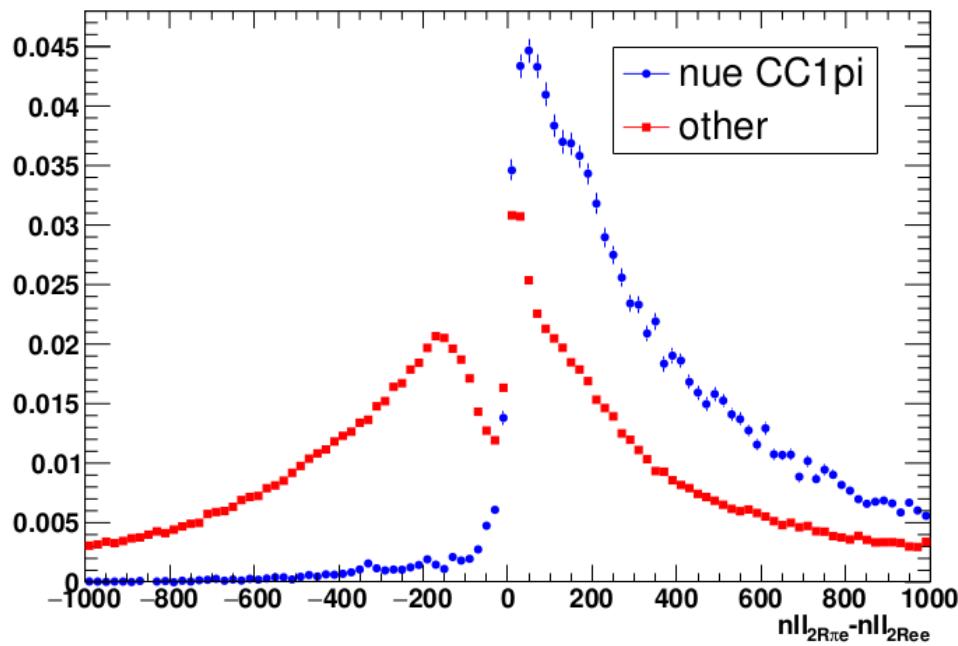


$nll_{2Re\pi} - nll_{2Ree}$: 2Re π -like

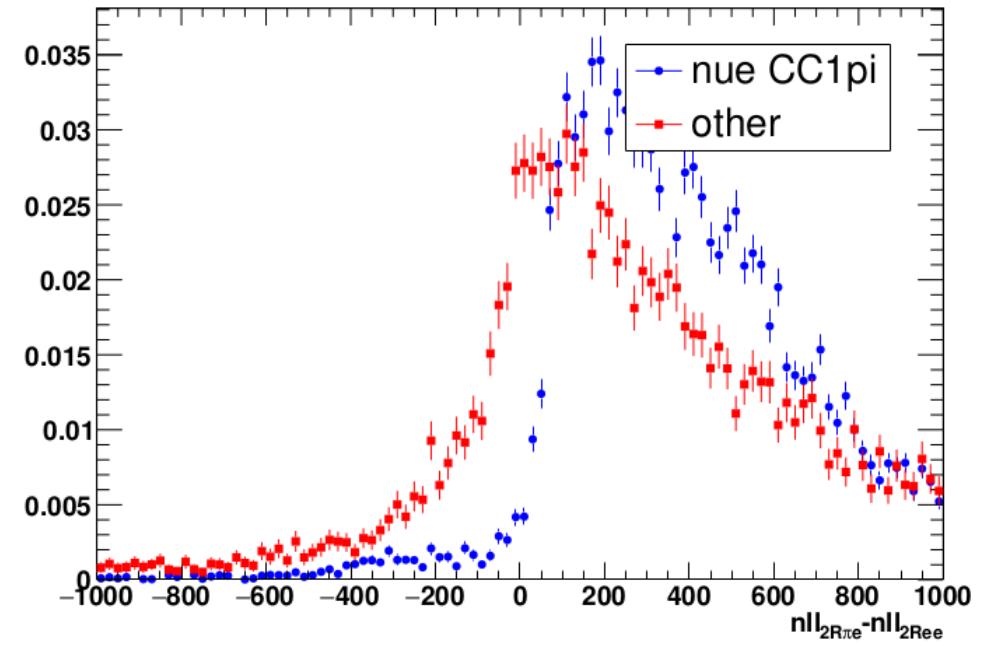


$2R\pi e$ vs $2R\text{ee}$

$nll_{2R\pi e} - nll_{2\text{Ree}}$: FCFV



$nll_{2R\pi e} - nll_{2\text{Ree}}$: 2Re π -like



Event Display

- Want to look at NC1 π^0 events in event display
 - better understand why these are being reconstructed as e π -like events
- Tried to look at T2K-SK MC zbs files using superscan:

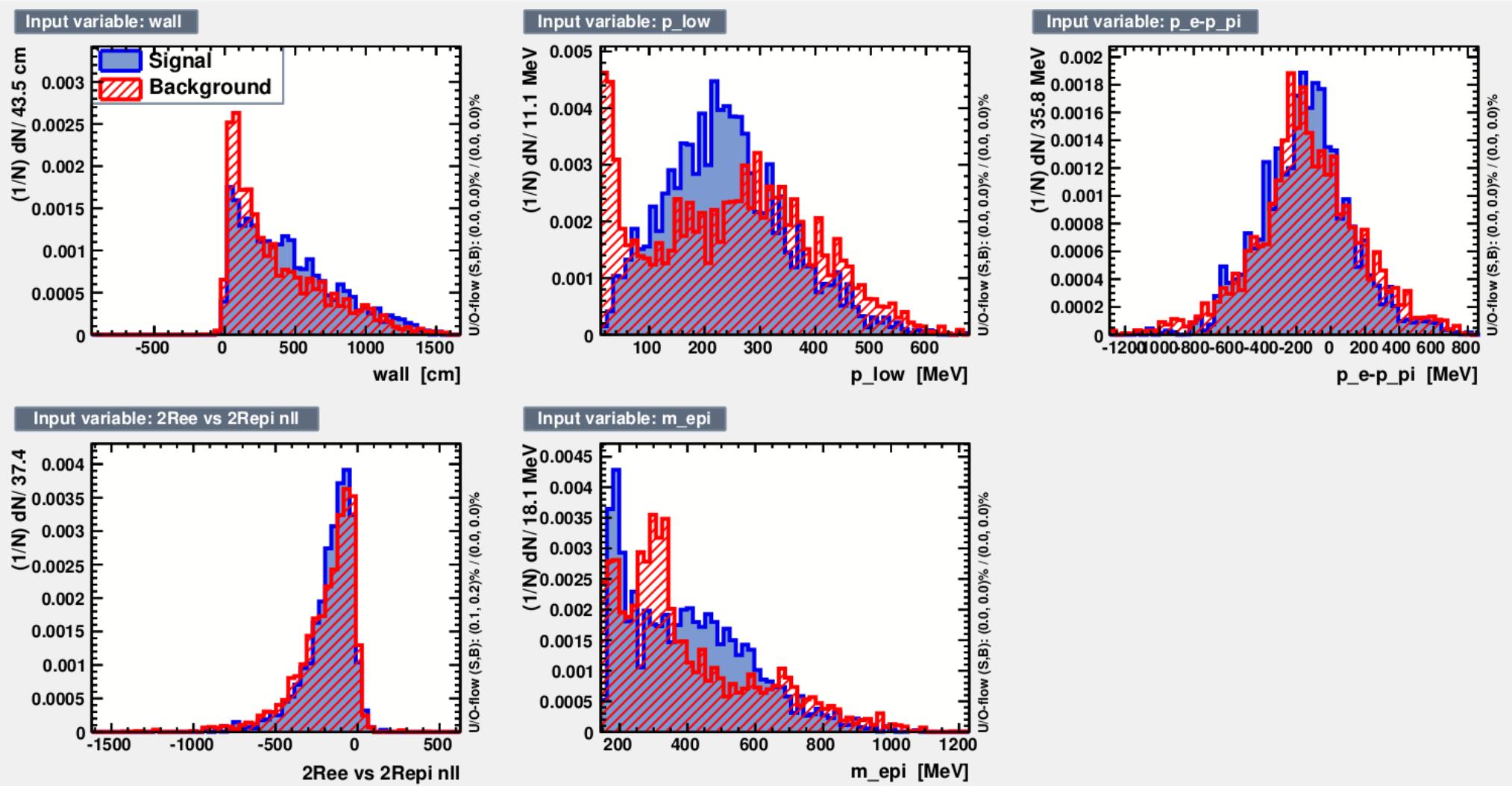
```
$ superscan -f numu_x_numu.h2o.sk.flux13a.neut_532_ap14a.000.000_fQv4r0.zbs
```

 - superscan loads, window forms, but then it crashes
 - are these files supposed to be able to be opened using superscan?
- Tried my own installation of the SK software on neut cluster, as well as one of Shimpei's installations on sukap

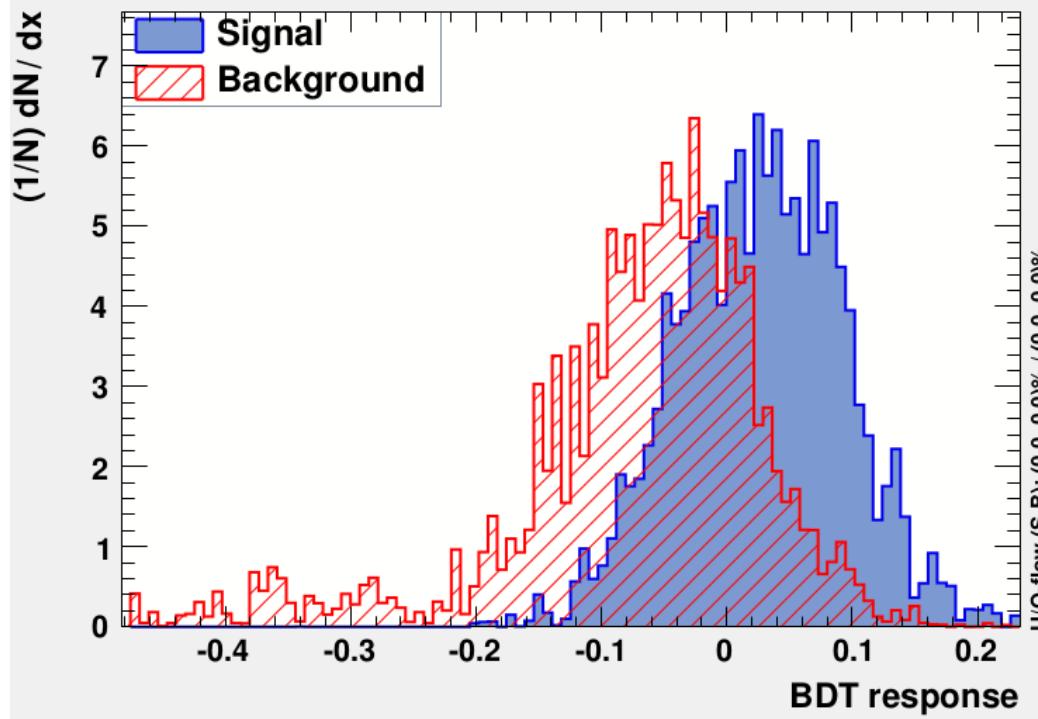
TMVA

- Some complications regarding rectangular cut optimization in TMVA:
 - Assumes signal is “clustered” along all user-supplied variables, and so only optimizes for cuts of the form ($\text{min} < x < \text{max}$)
 - This doesn’t work when the background is clustered rather than the signal
 - In general, seem to be getting strange results using TMVA’s rectangular cut optimization... still investigating
- In the meantime, I’ve gotten some more promising results using BDTs and NNs

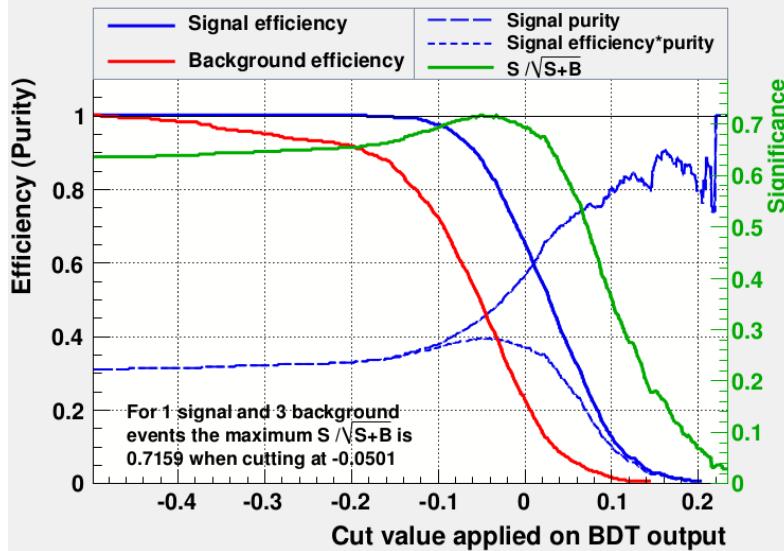
Boosted Decision Tree



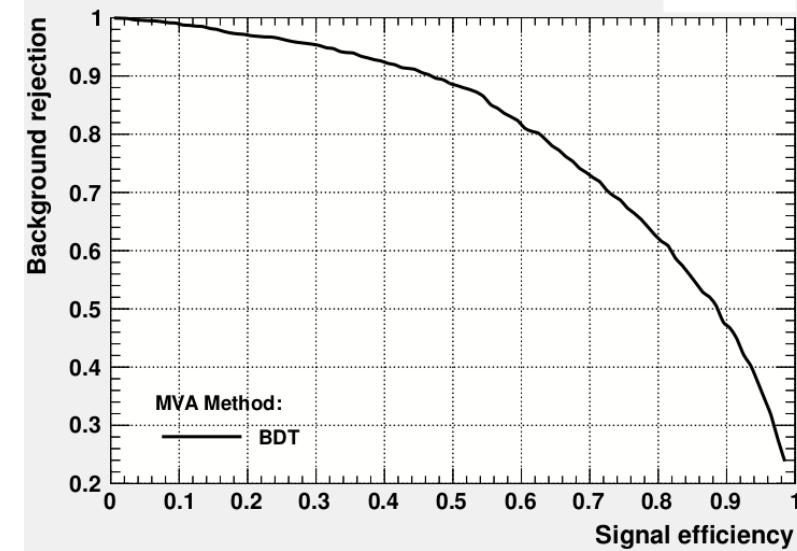
TMVA response for classifier: BDT



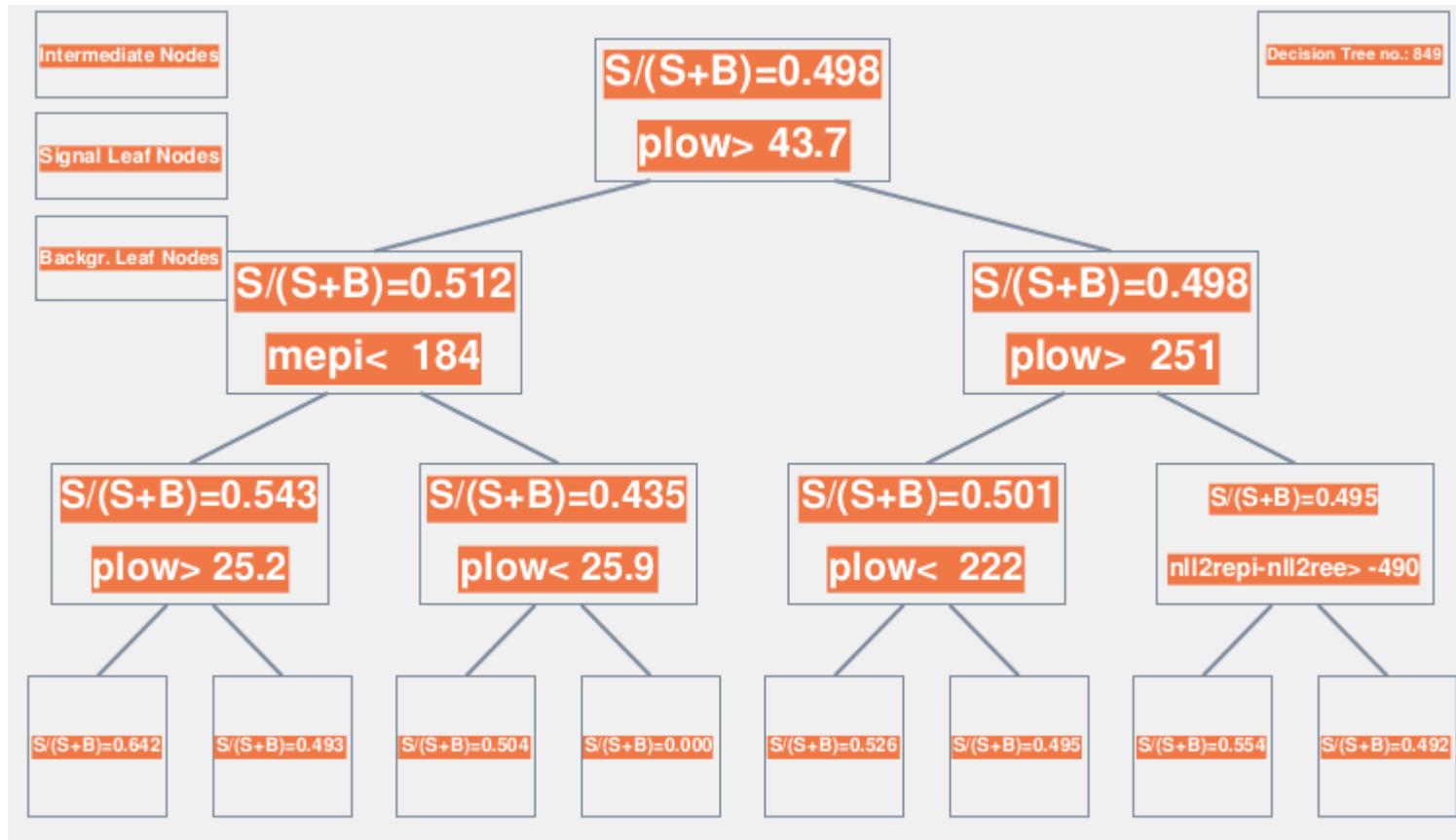
Cut efficiencies and optimal cut value



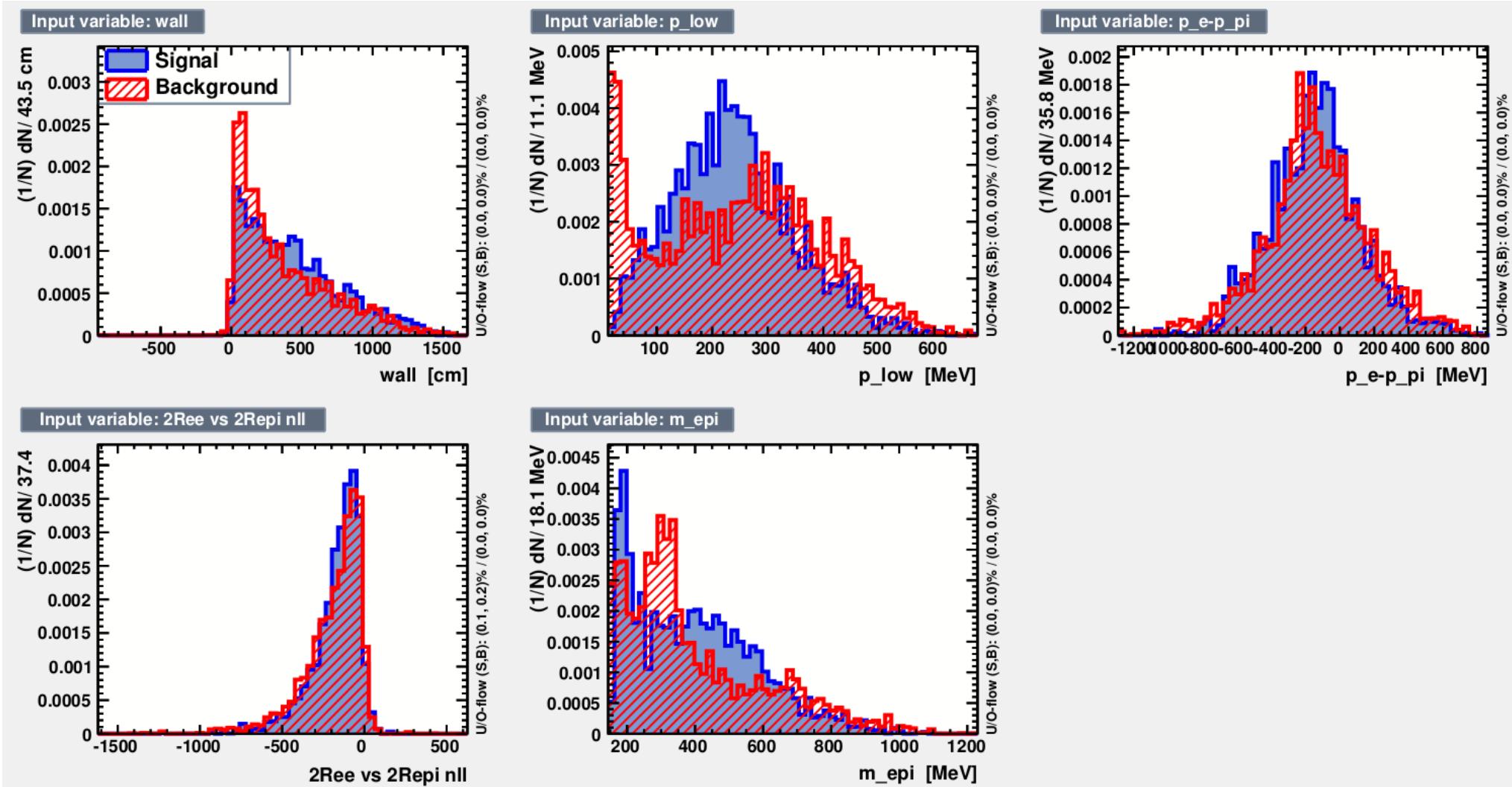
Background rejection versus Signal efficiency



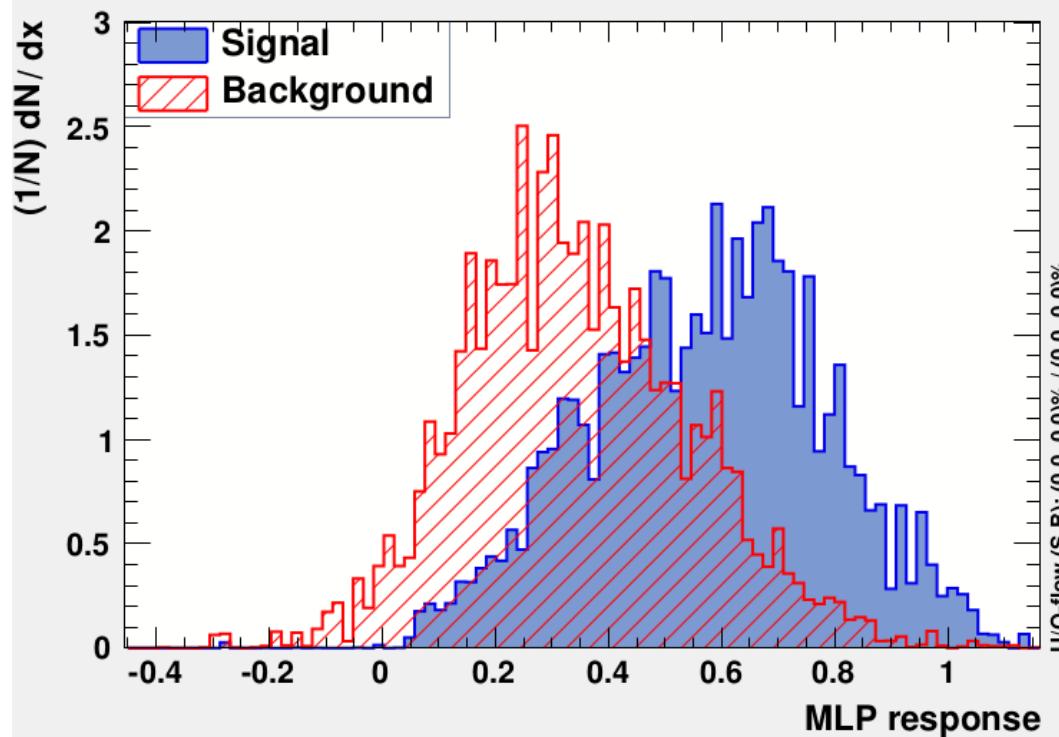
An example decision tree (one of 850)



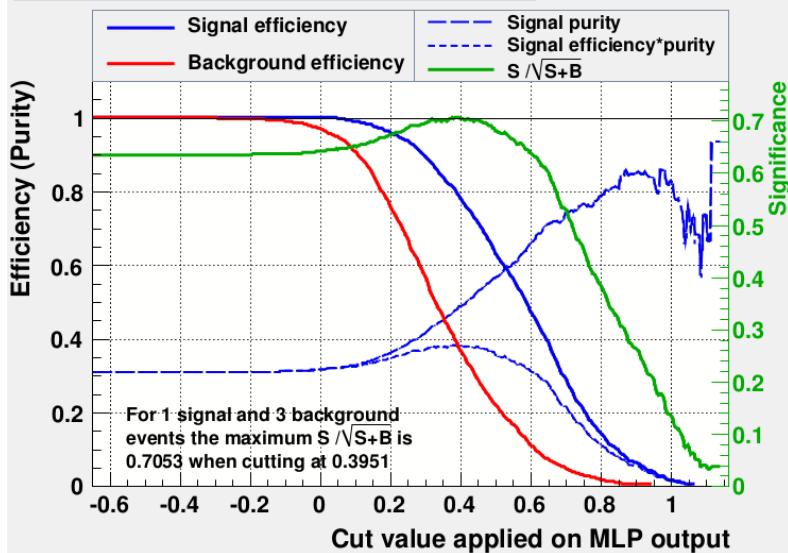
Neural Network



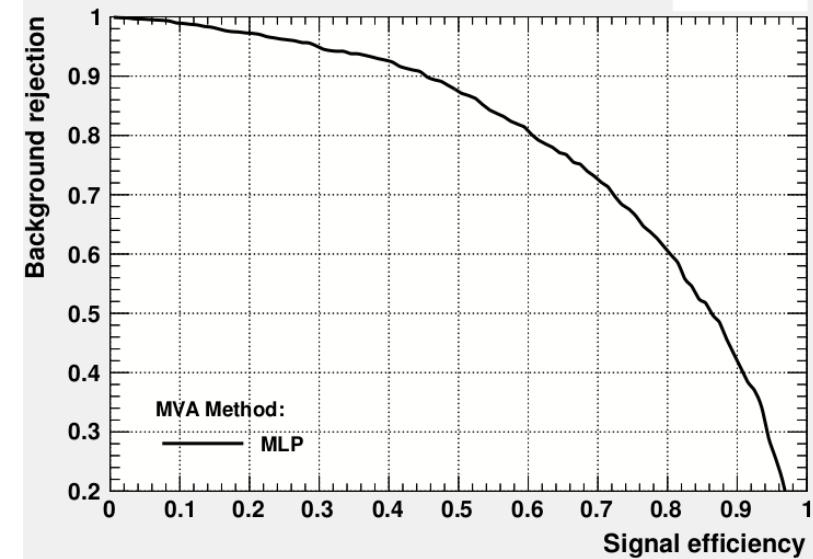
TMVA response for classifier: MLP



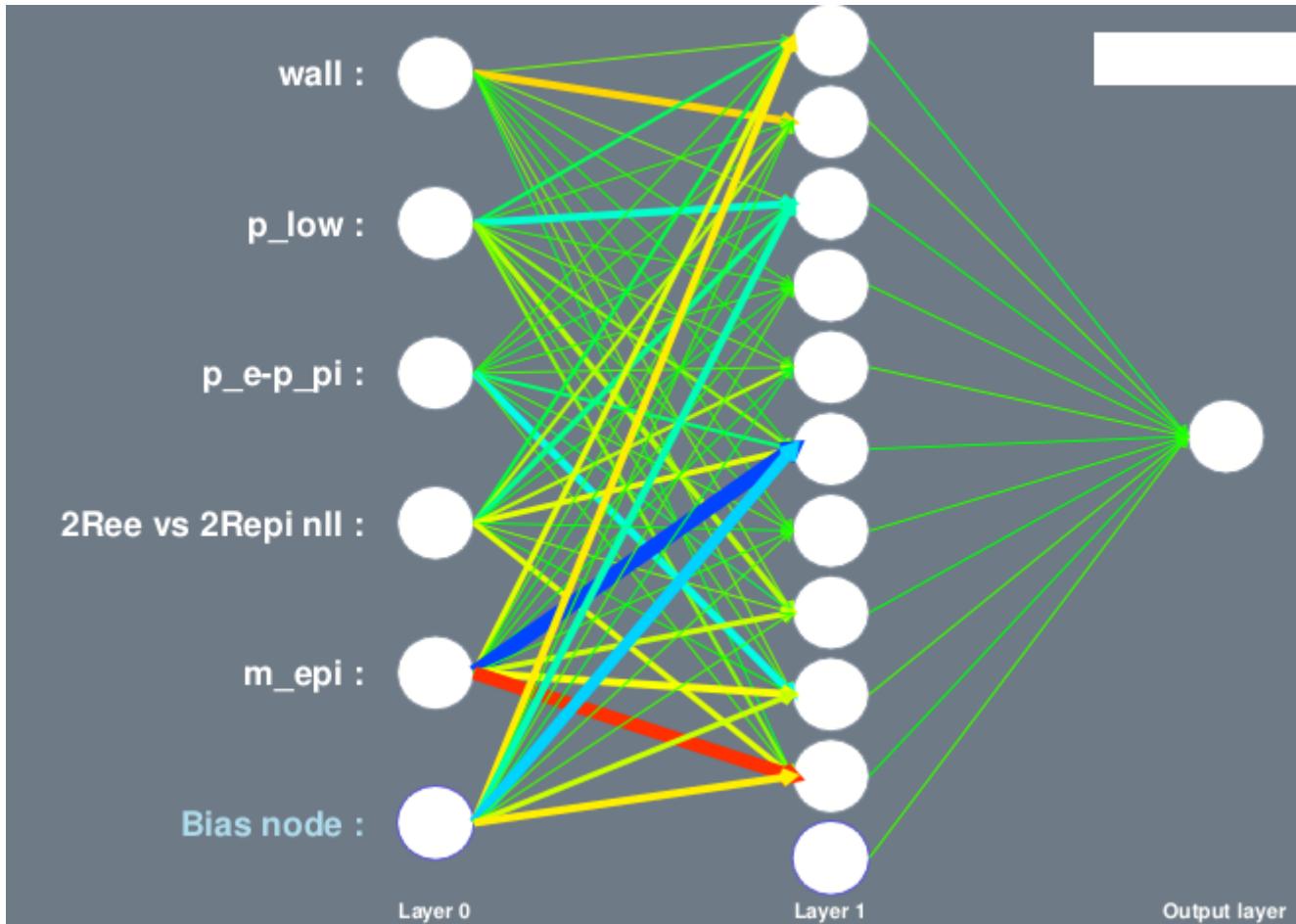
Cut efficiencies and optimal cut value



Background rejection versus Signal efficiency



Neural Network Visualization



Other things on the to-do list

- Investigate events where a proton is above Cherenkov threshold (suggested by Mike)