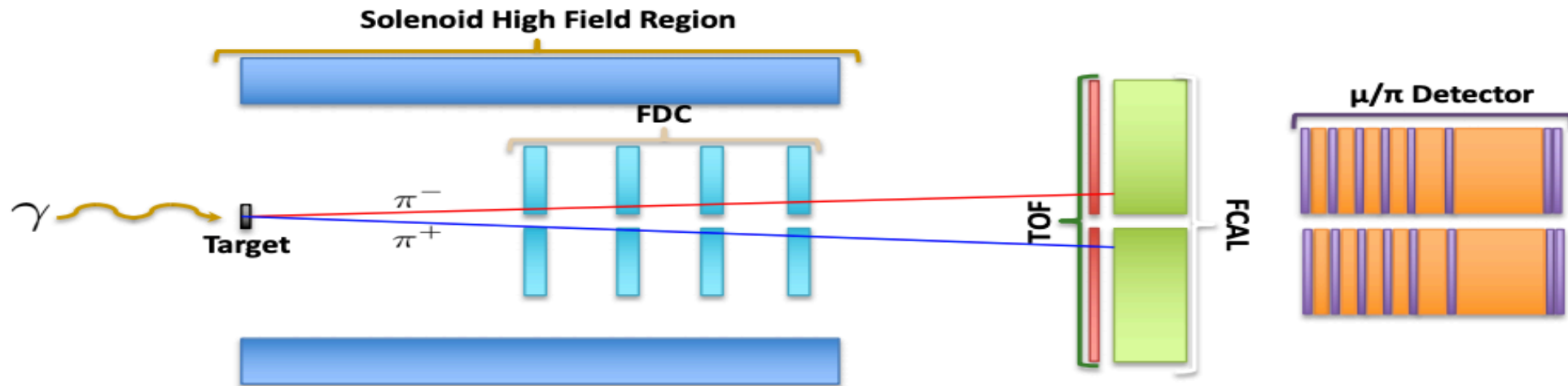


$e/\pi/\mu$ SEPARATION IN CPP

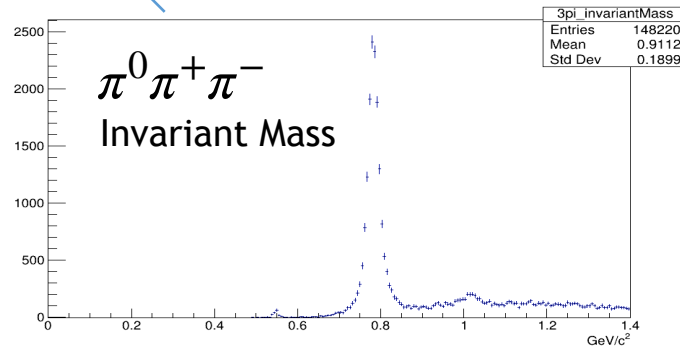
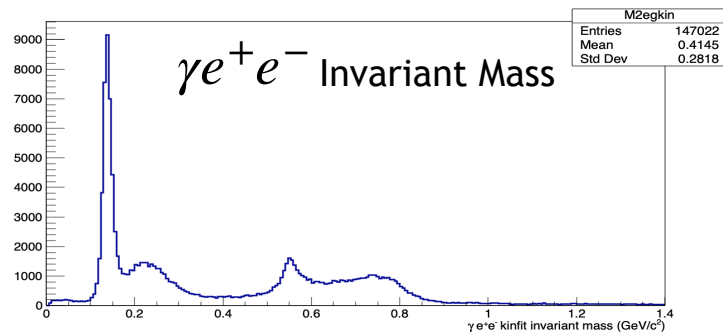
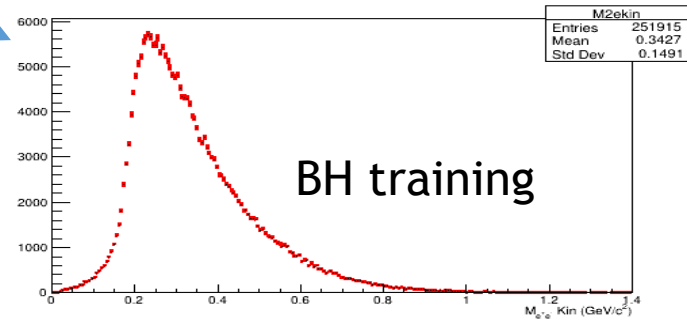
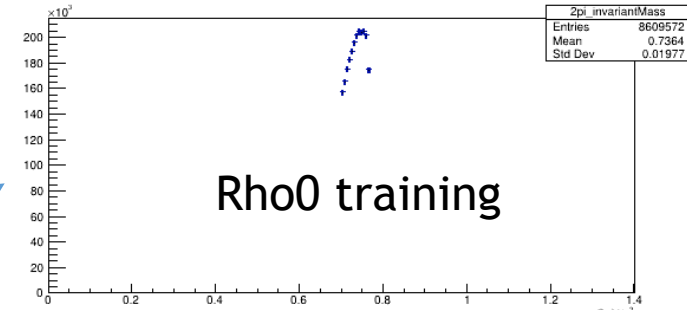
- In order to make a precision measurement of the charged pion polarizability, need to address backgrounds: Bethe-Heitler electrons and muons.
- Two independent studies for e/π and μ/π identification
 - e/π separation focuses on quantities from the forward calorimeter (FCAL).
 - μ/π separation combines information from FCAL and new detector system (MWPCs) into one number you can cut on. TMVA guided the mechanical design of the iron absorbers in the muon system.



MVA FOR ELECTRON/PION SEPARATION

SUMMARY

- 2 Multi-layer perceptron neural nets— one for e^-/π^- separation, one for e^+/π^+ .
- Train on rho0 pions ($700 \text{ MeV} < W < 770 \text{ MeV}$) and simulated Bethe-Heitler electron pairs
- Use $\pi^0 \rightarrow \gamma e^+ e^-$ and $\omega(782) \rightarrow \pi^0 \pi^+ \pi^-$ reactions as a way to test performance of the neural nets.

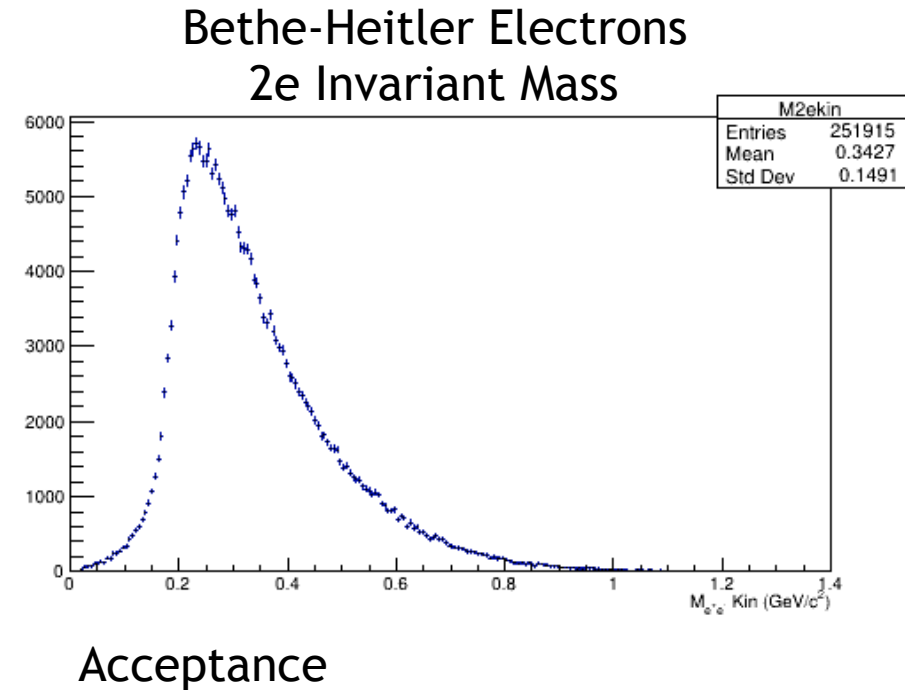
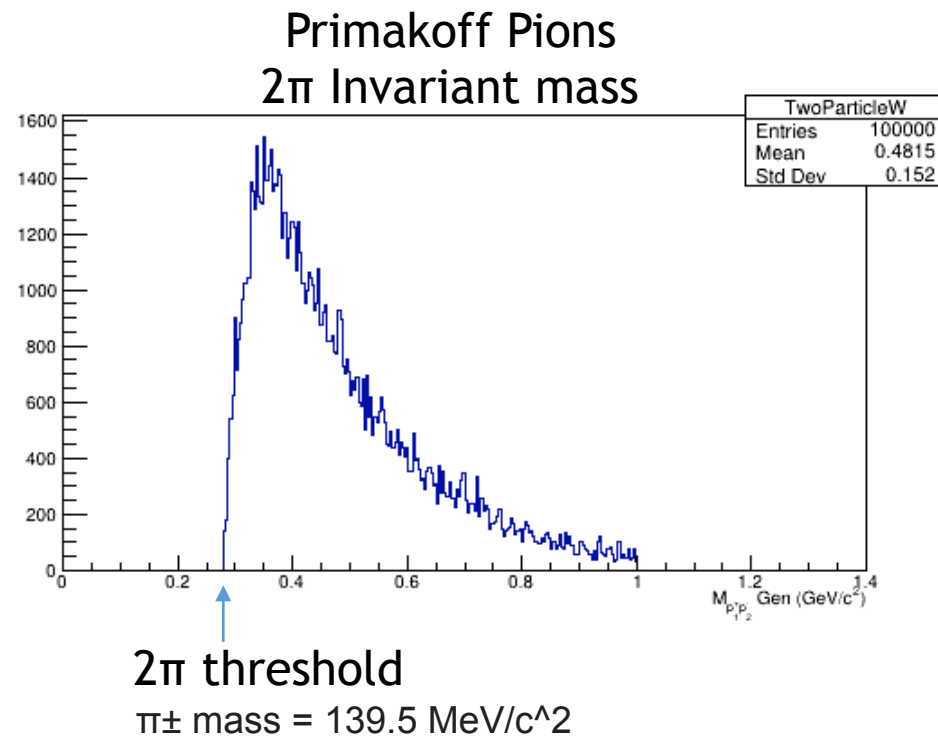


Training Samples

We use ρ^0 pion data, and BH electron Monte Carlo for training our single track neural nets

CHOOSING TRAINING SAMPLES FOR e/π NEURAL NET

For CPP Experiment, need to separate Primakoff Pions (signal) from BH electrons (background).

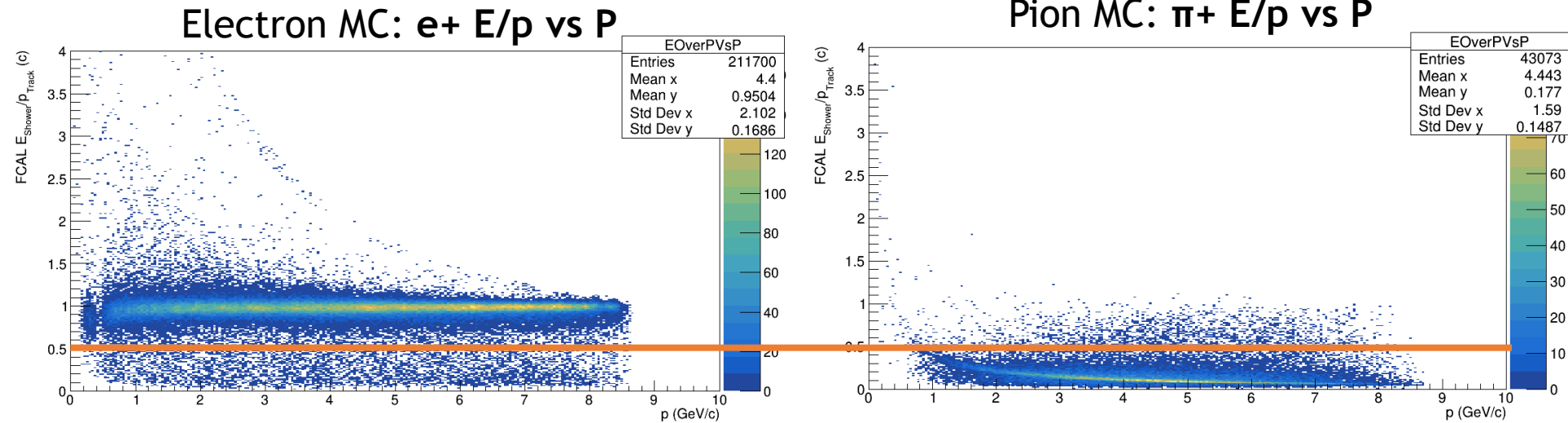


CHOOSING TRAINING SAMPLES FOR e/π NEURAL NET

- Data or Simulation?

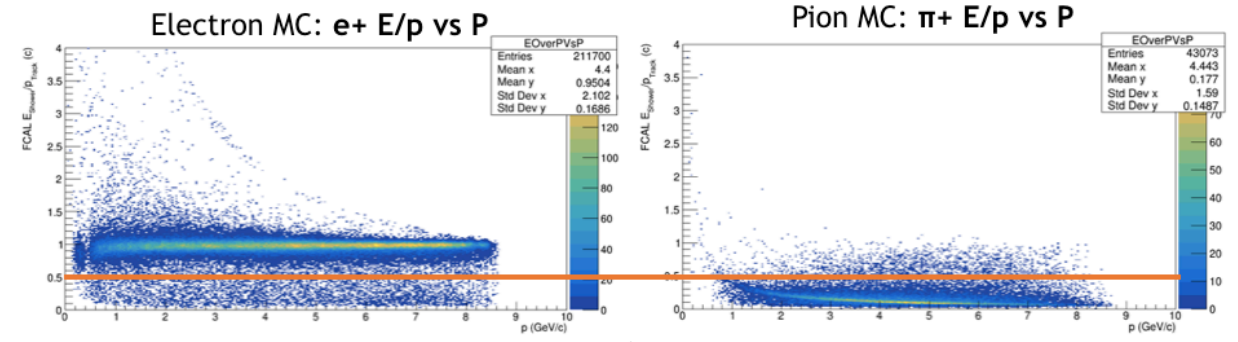
TRAINING SAMPLES FOR e/π NEURAL NET

- Pion training: Data or *Simulation*?

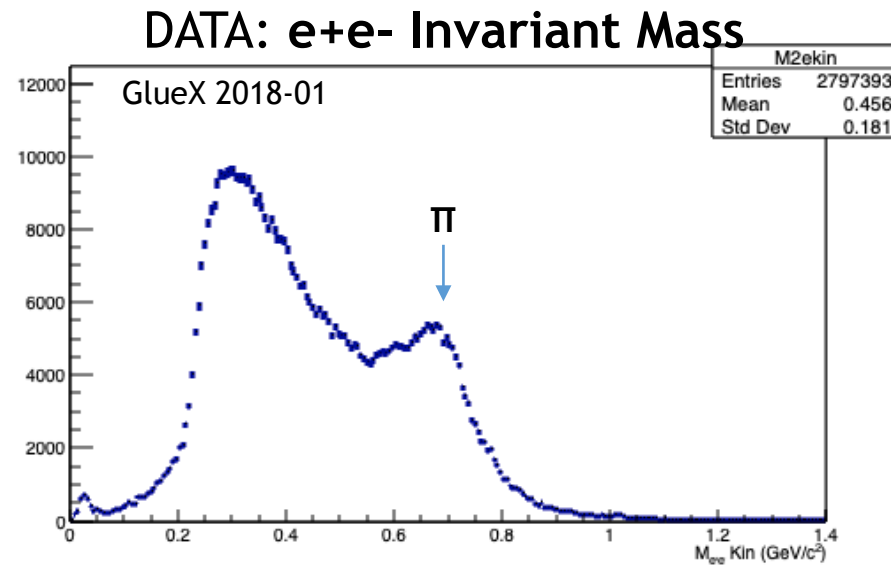
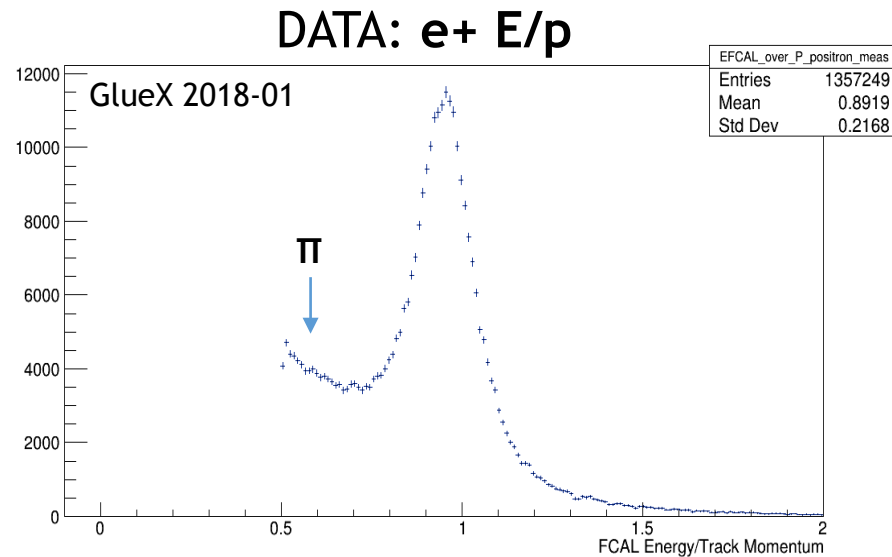


TRAINING SAMPLES FOR e/π NEURAL NET

- Pion training: Data or *Simulation*?

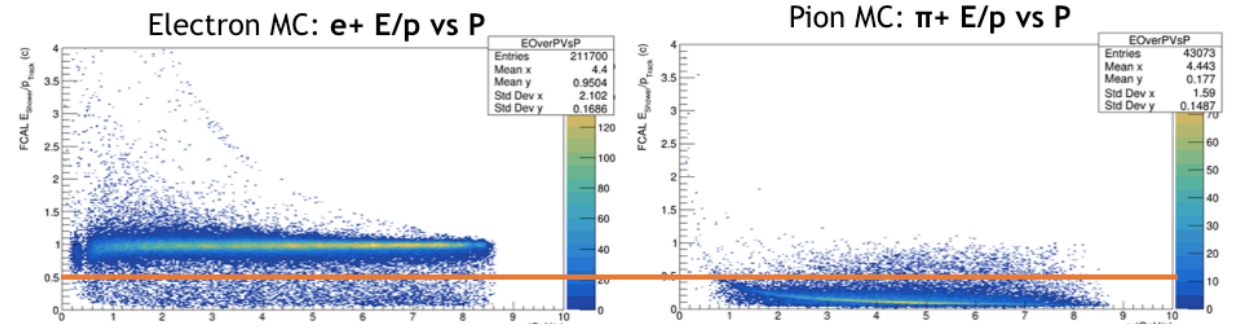


Require $E/p > 0.5$ for both e^+e^- tracks and look at data:

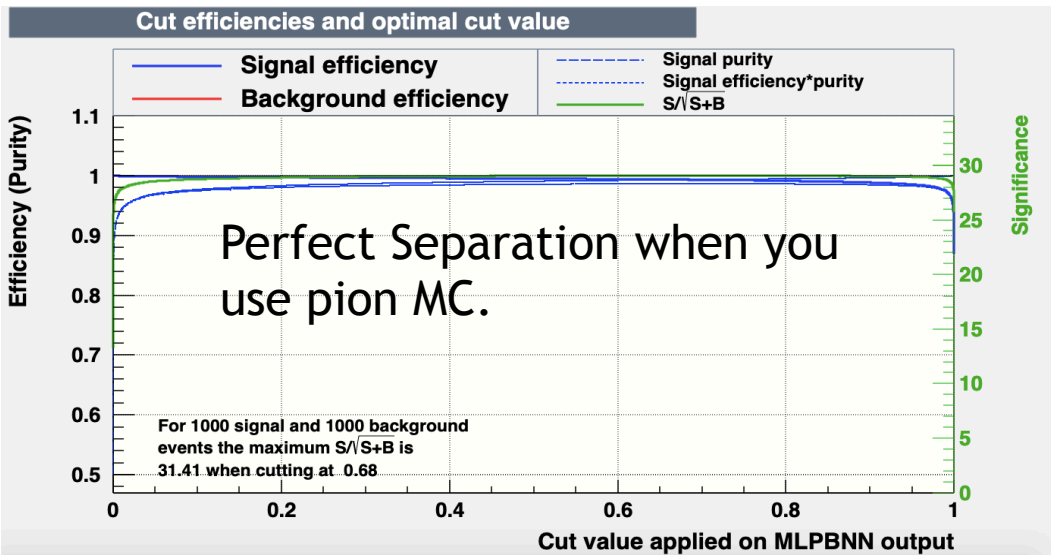
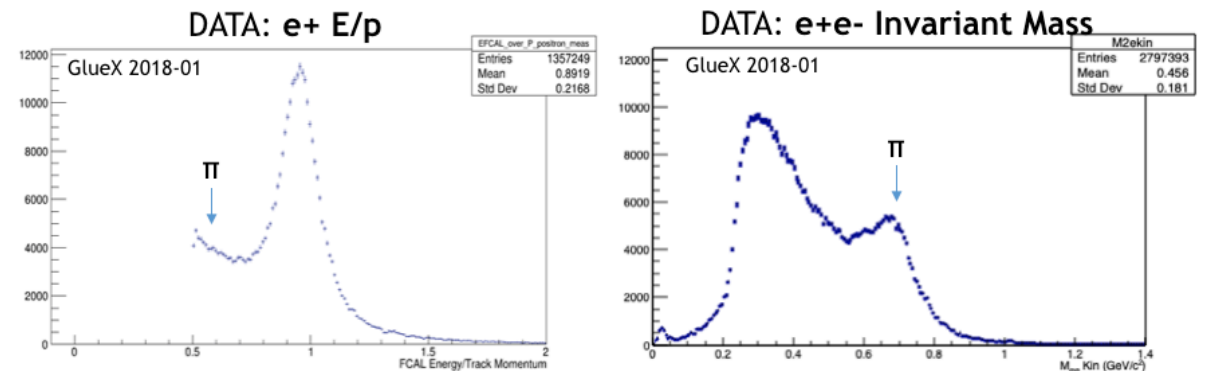


TRAINING SAMPLES FOR e/π NEURAL NET

- Pion training: Data or *Simulation*?

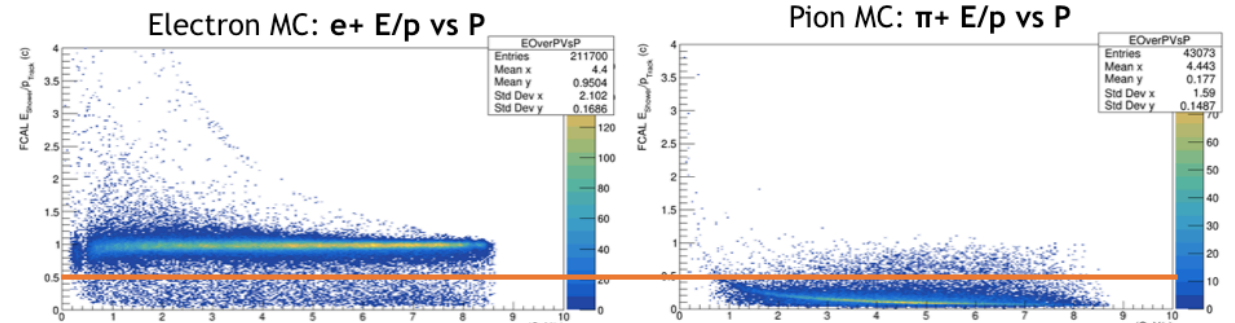


Require $E/p > 0.5$ for both $e+e-$ tracks and look at data:

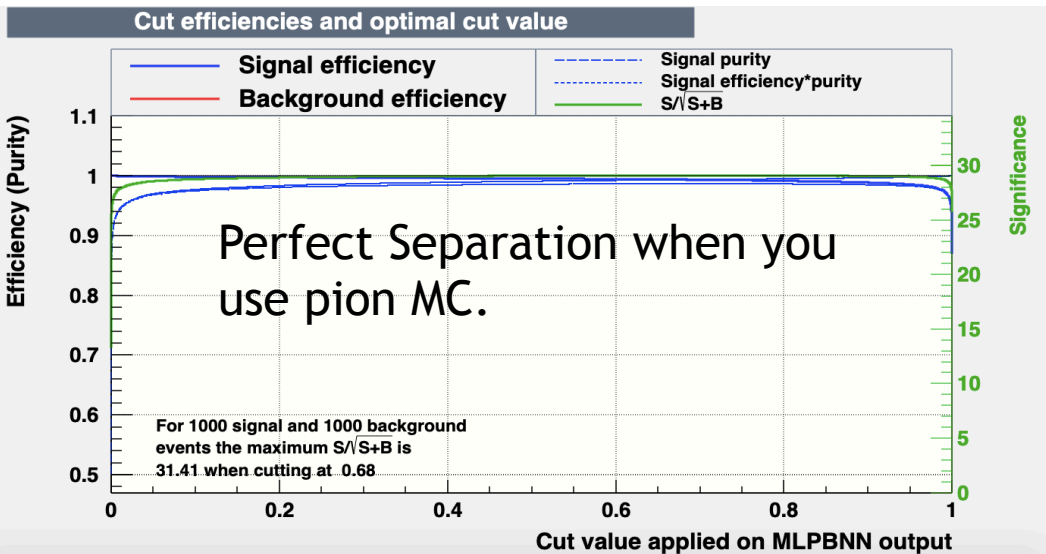
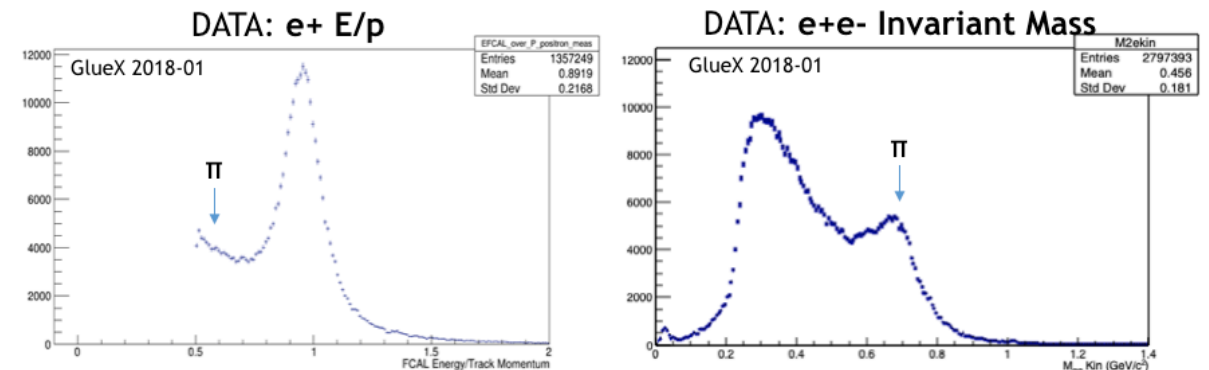


TRAINING SAMPLES FOR e/π NEURAL NET

- Pion training: Data or *Simulation*?



Require $E/p > 0.5$ for both $e+e-$ tracks and look at data:



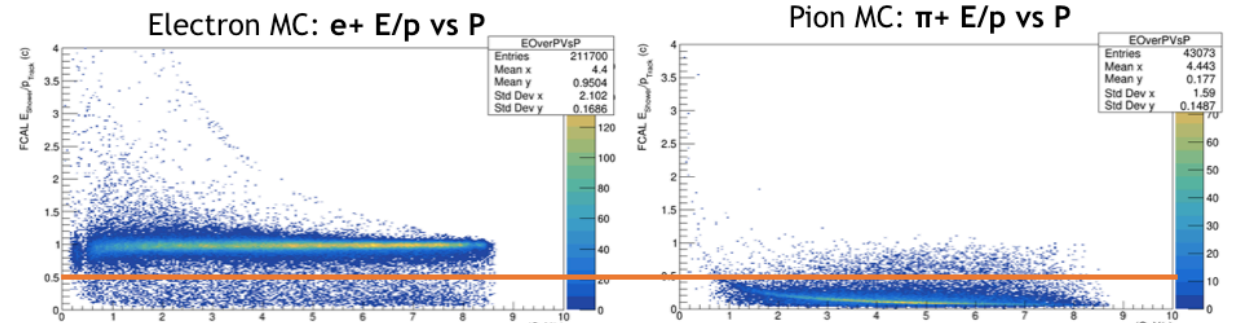
Questions that must be answered:

Is modeling of hadronic showers in calorimeter good enough?

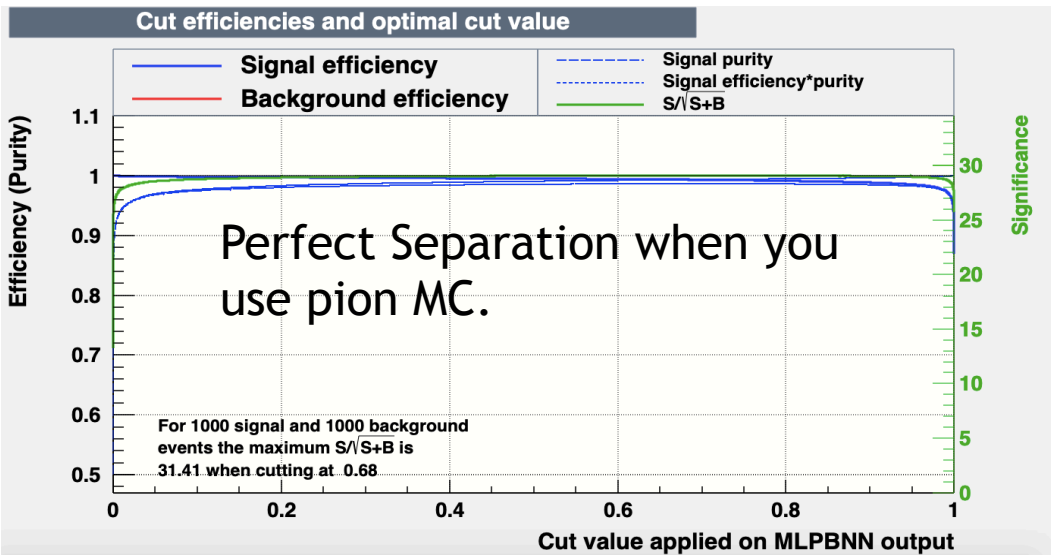
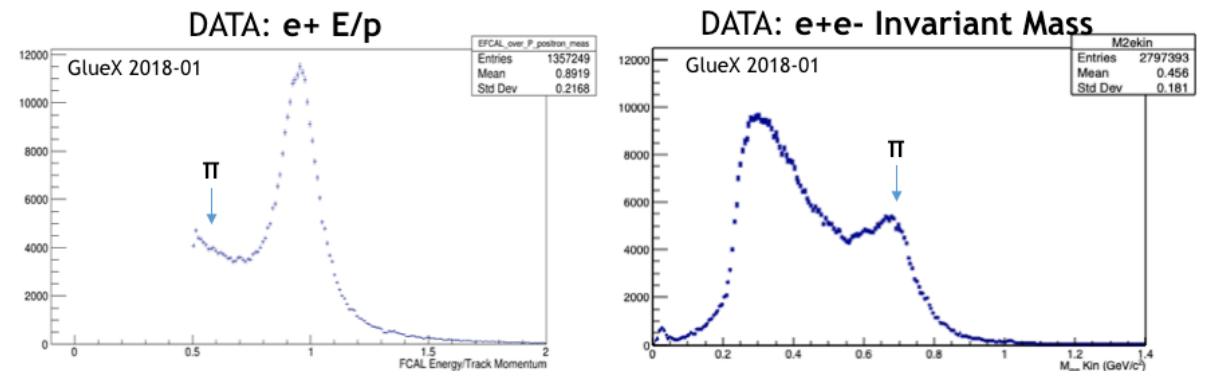
Is sample size of pions too small to be representative?

TRAINING SAMPLES FOR e/π NEURAL NET

- Pion training: Data or *Simulation*?



Require $E/p > 0.5$ for both $e+e-$ tracks and look at data:



Questions that must be answered:

Is modeling of hadronic showers in calorimeter good enough?

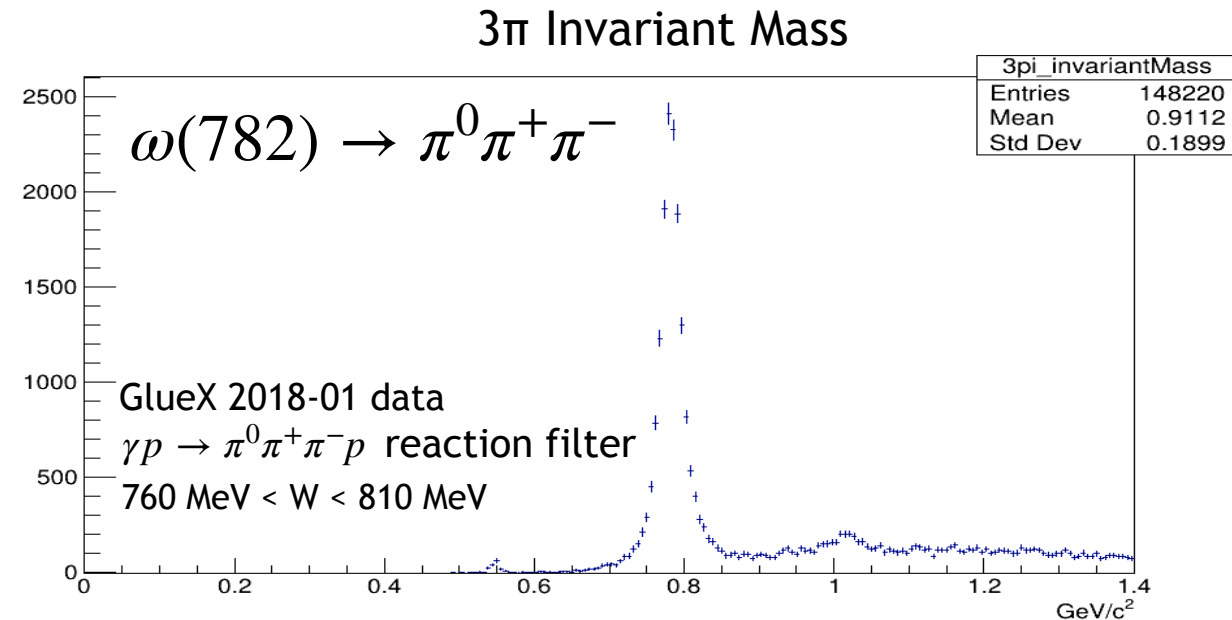
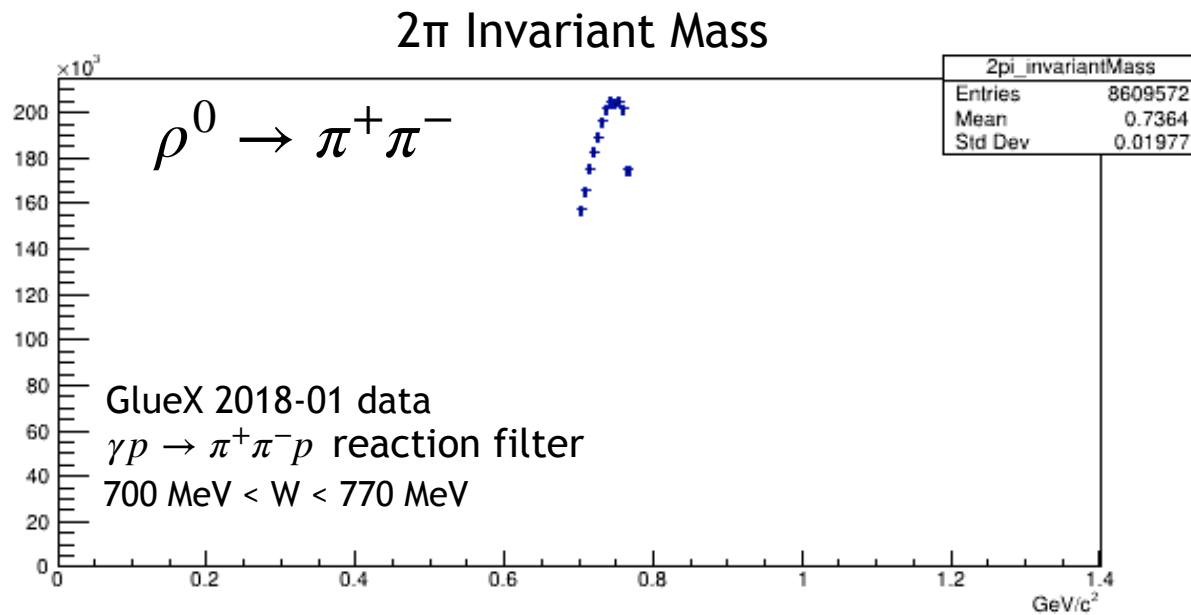
Is sample size of pions too small to be representative?

Can we just get a pure sample of $\pi^+\pi^-$ data for training?

TRAINING SAMPLES FOR e/π NEURAL NET

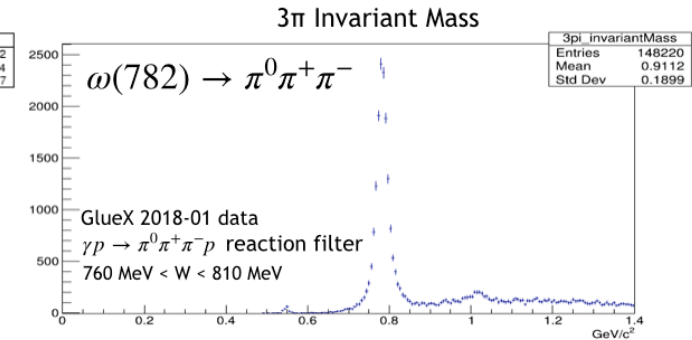
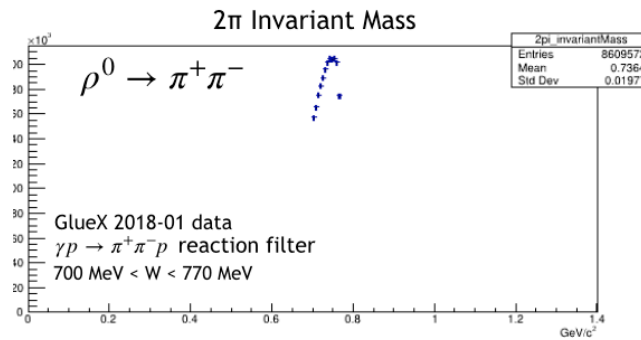
- Pion training: *Data* or *Simulation*?

Can we just get a pure sample of $\pi^+\pi^-$ data for training? Yes.



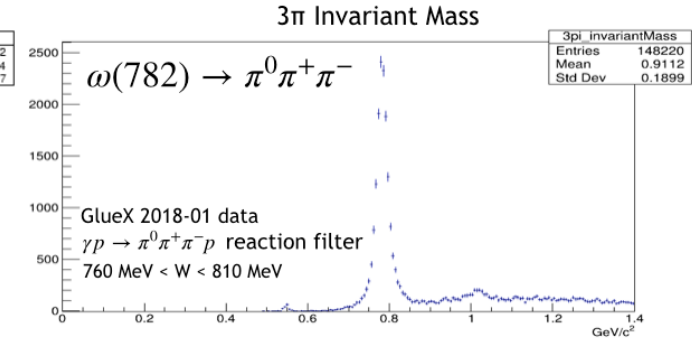
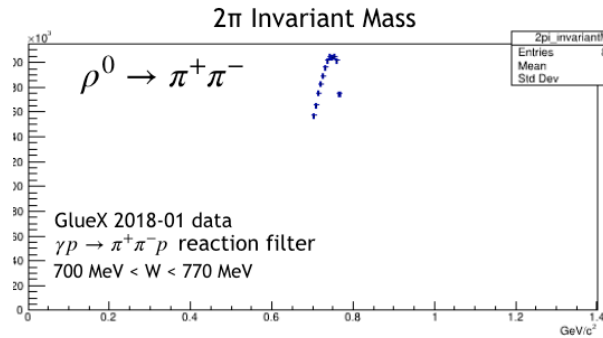
TRAINING SAMPLES FOR e/π NEURAL NET

- Pion training: *Data* or *Simulation*?
 - Which source to use?
 - > should be as close to Primakoff kinematics as possible.

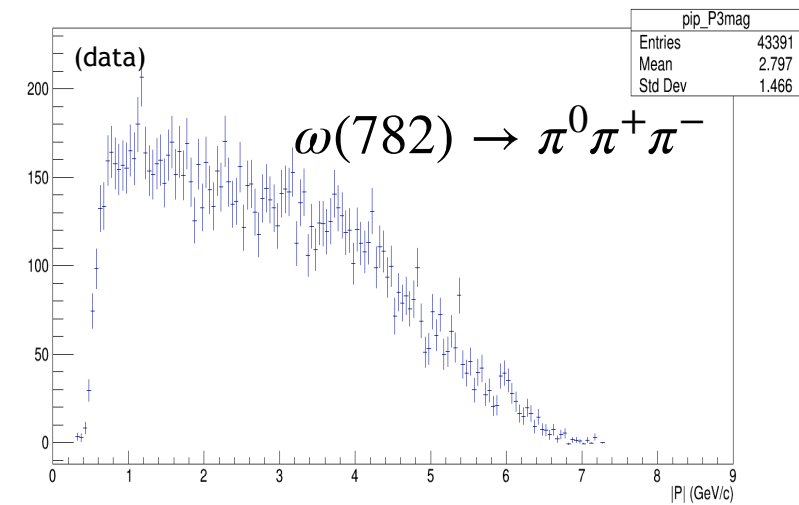
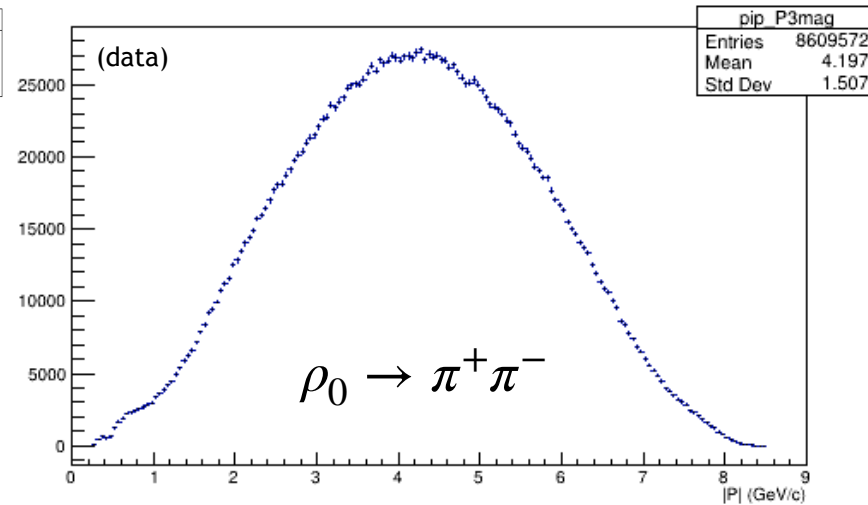
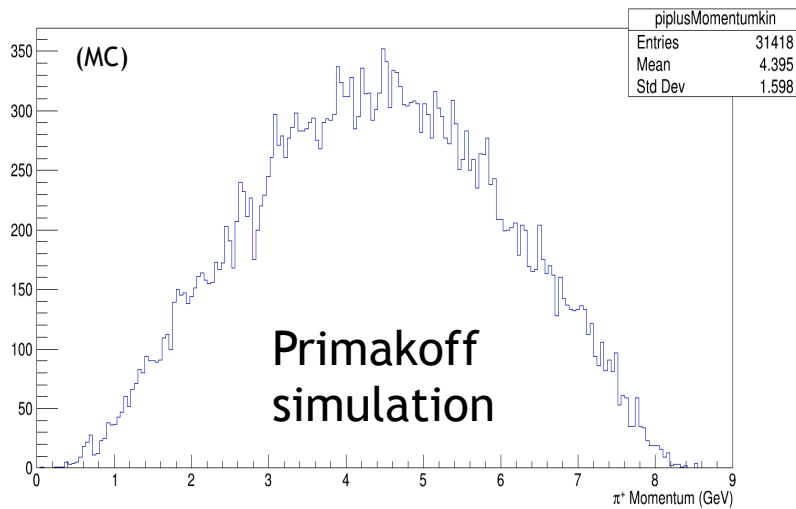


TRAINING SAMPLES FOR e/π NEURAL NET

- Pion training: *Data or Simulation?*
 - Which source to use?
 - should be as close to Primakoff kinematics as possible.

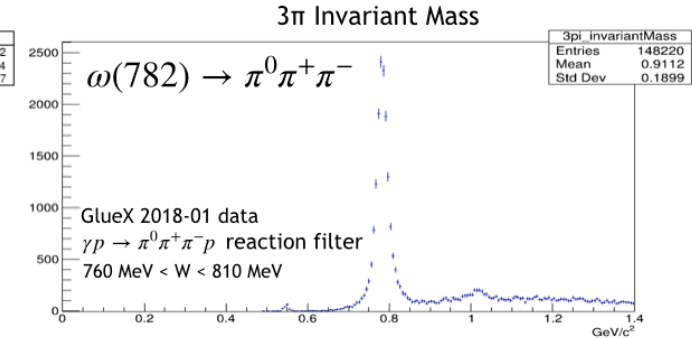
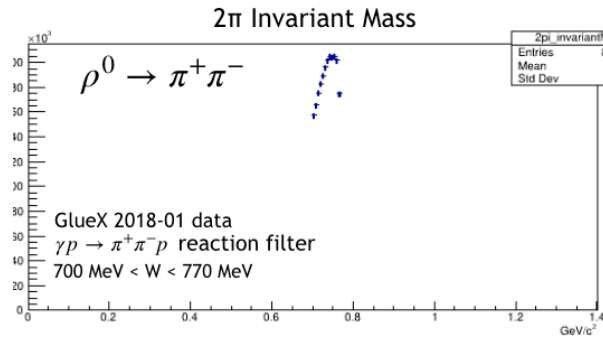


π^+ MOMENTUM

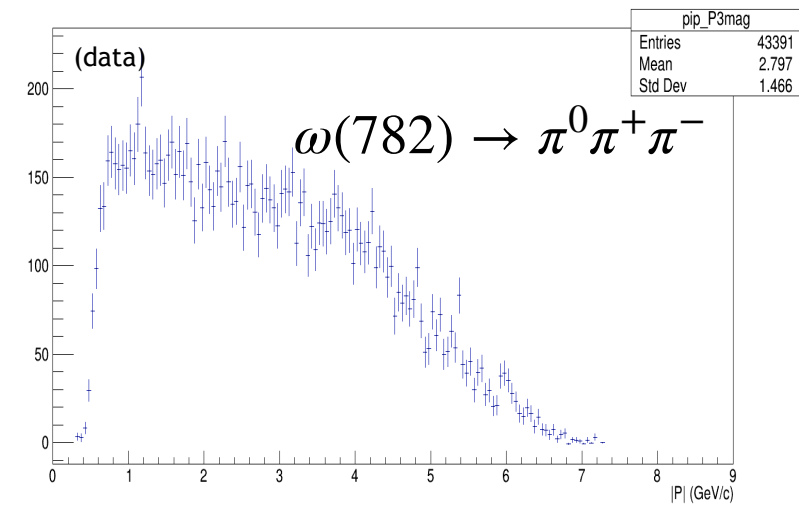
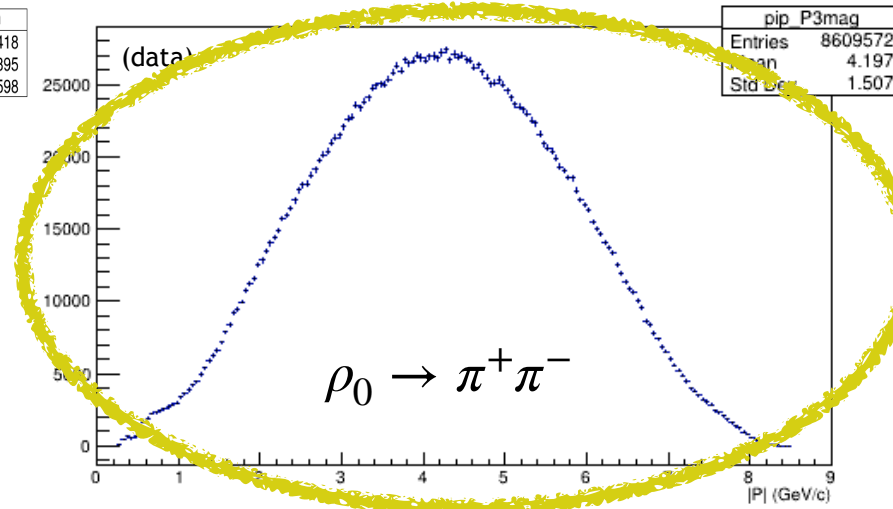
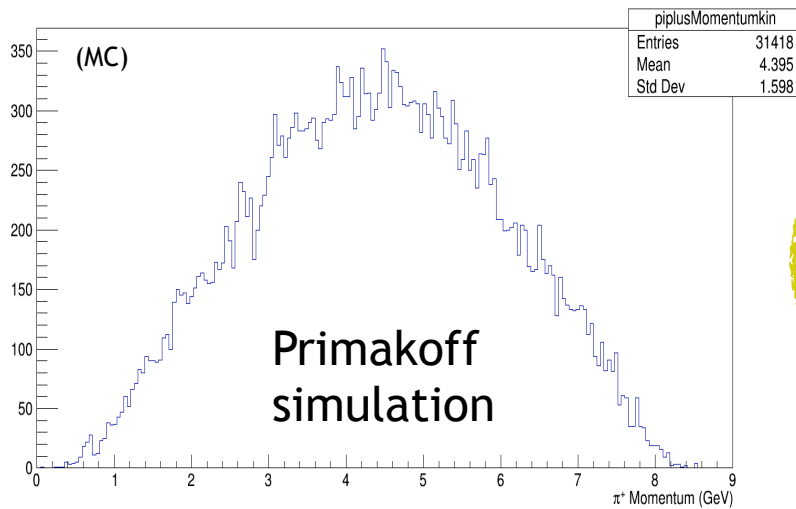


TRAINING SAMPLES FOR e/π NEURAL NET

- Pion training: *Data or Simulation?*
 - Which source to use?
 - should be as close to Primakoff kinematics as possible.



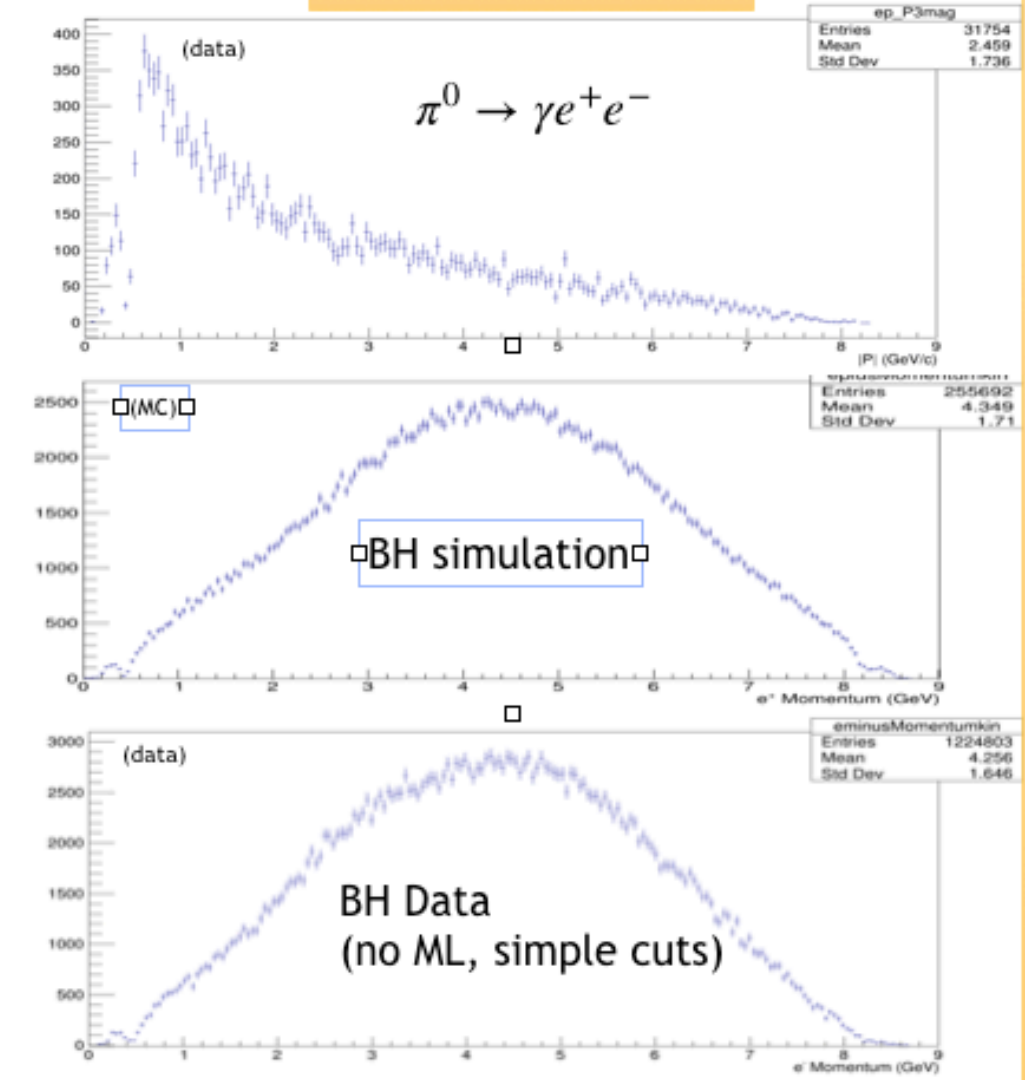
π⁺ MOMENTUM



TRAINING SAMPLES FOR e/π NEURAL NET

- Pion Training: ρ^0 Data
- Electron Training: Data or Simulation?
 - Bethe-Heitler electrons are the background in CPP, so ideally we should train on them. Are either BH in GlueX data or MC viable for training? Data from other source?
 - Pure BH data samples are hard to obtain for the same reason we can easily train on pion data—contamination from ρ^0 pions dominates.
 - QED is very well understood—no reason to suspect that the modeling of calorimeter showers is inadequate.

POSITRON MOMENTUM



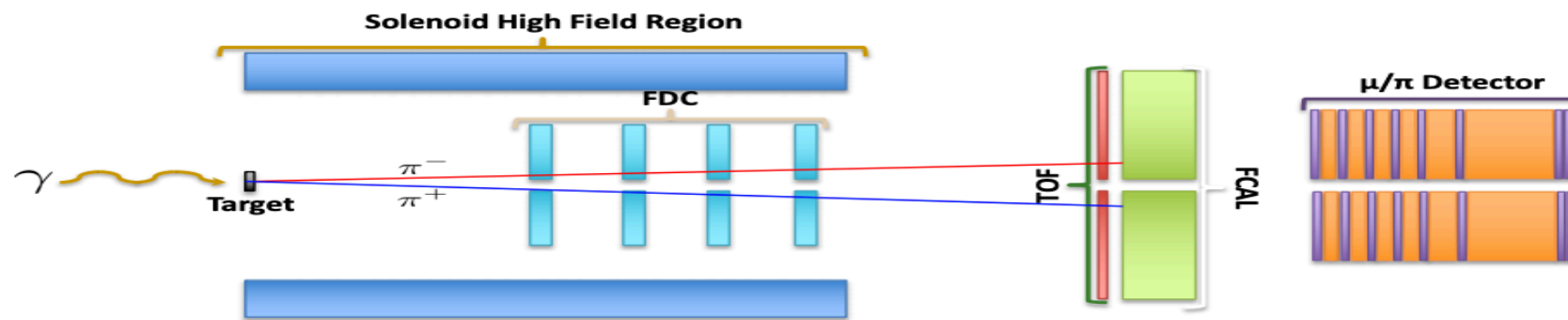
Training Variables

We train on 3 variables with quantities constructed from the particle momentum and the forward calorimeter (FCAL):

E/p , $E9/E25$ Shower Ratio, FCAL DOCA

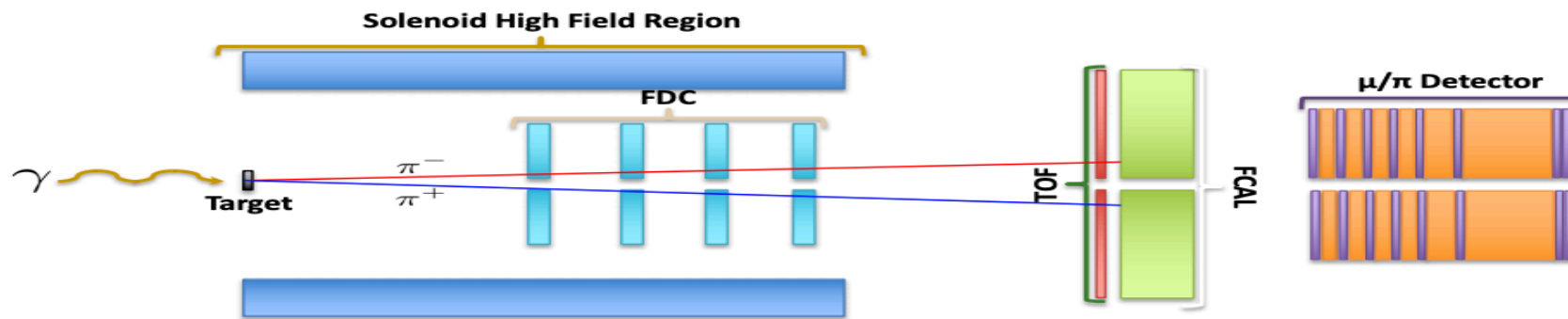
TRAINING VARIABLE SELECTION

- The CPP measurement will be made with low t , forward going Primakoff pions. Therefore the e/π neural net can only use quantities from forward detectors—FDC, TOF, FCAL.



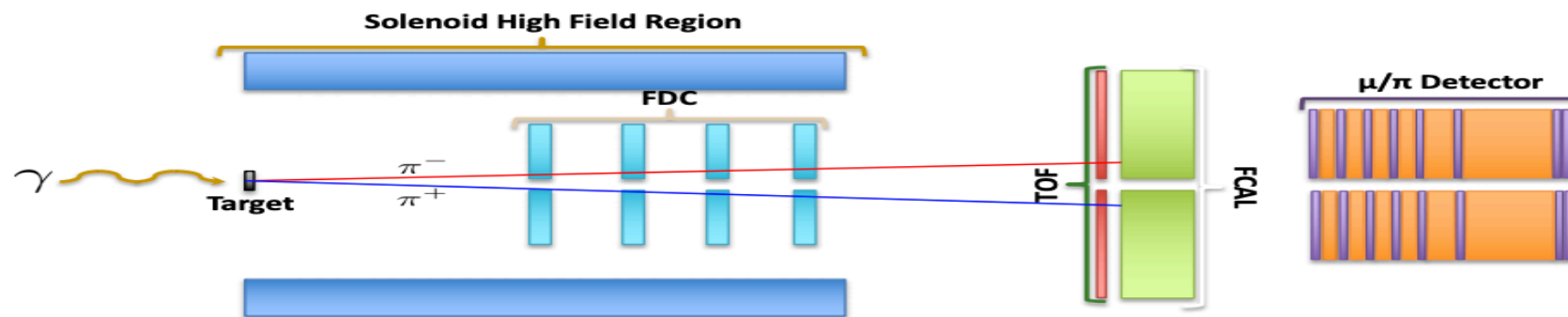
TRAINING VARIABLE SELECTION

- The CPP measurement will be made with low t , forward going Primakoff pions. Therefore the e/π neural net can only use quantities from forward detectors—FDC, TOF, FCAL.
- Of the forward detectors, FCAL is (probably) the only useful one for e/π separation.



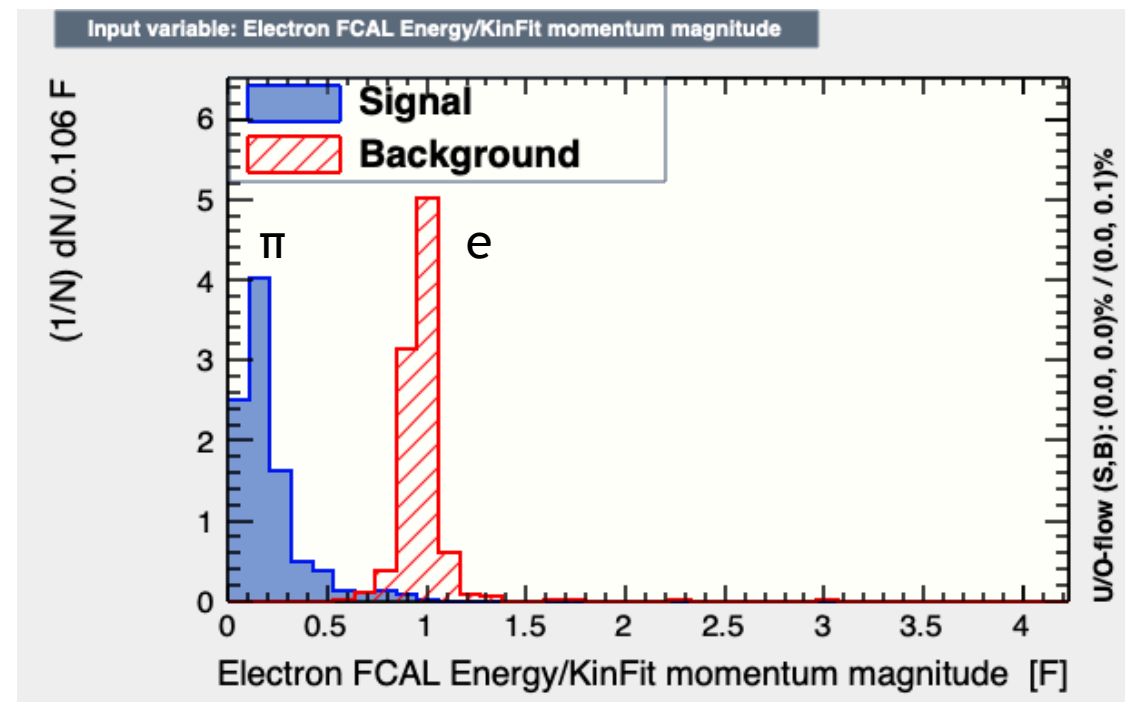
TRAINING VARIABLE SELECTION

- The CPP measurement will be made with low t , forward going Primakoff pions. Therefore the e/π neural net can only use quantities from forward detectors—FDC, TOF, FCAL.
- Of the forward detectors, FCAL is (probably) the only useful one for e/π separation.
- If the NN finds useful information elsewhere, the concern would be that it's relying on kinematics of ρ^0 versus BH, and would struggle to identify pions from other sources, e.g. Primakoff pions.



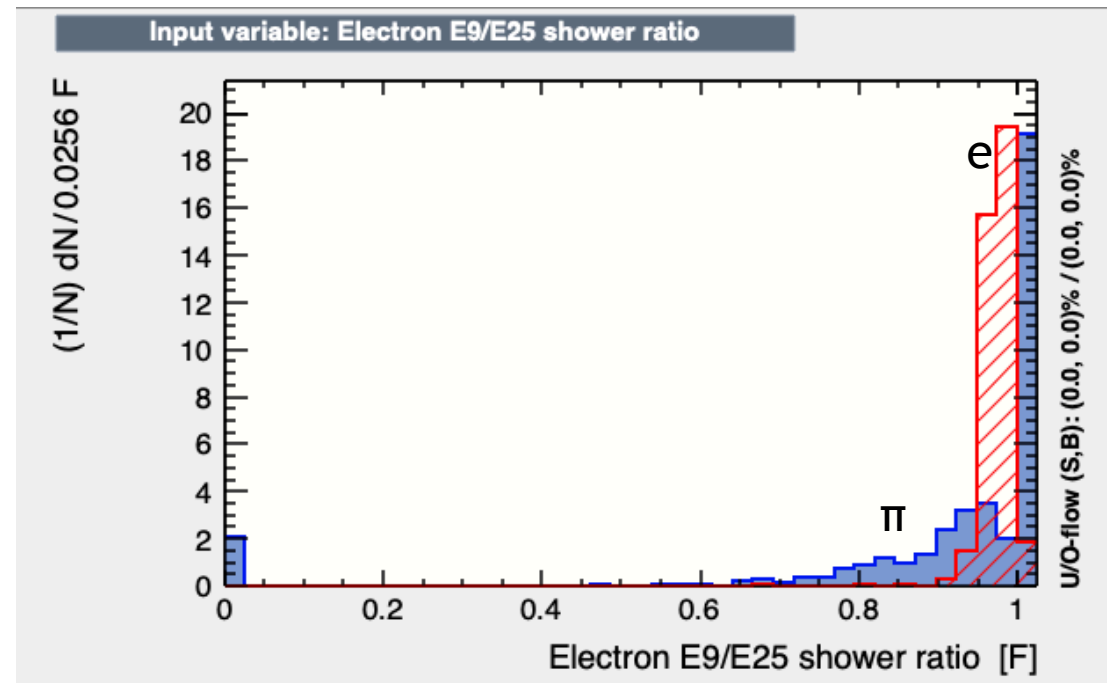
VARIABLE 1: E OVER P

E is the shower energy deposited in the forward calorimeter that is associated with the charged track.
P is the magnitude of the 3-momentum of that charged track.



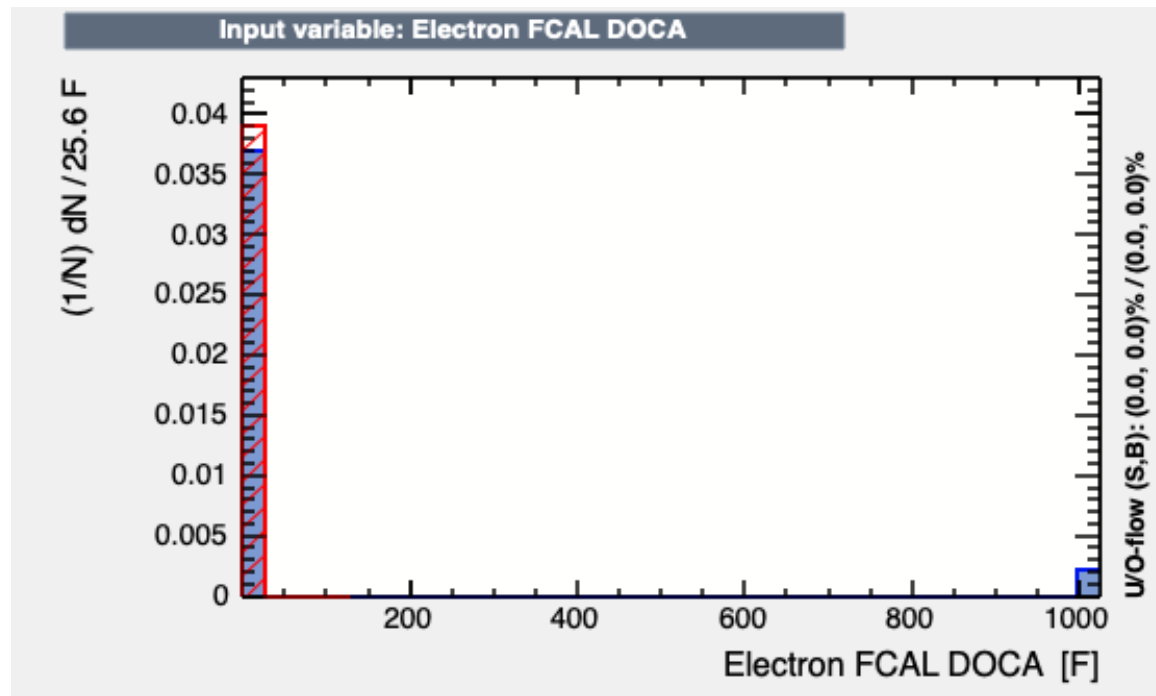
VARIABLE 2: E9/E25 SHOWER RATIO

E9 and E25 are the sum of the energies in a 3x3 and 5x5 square around the crystal in which the center of the shower lies.



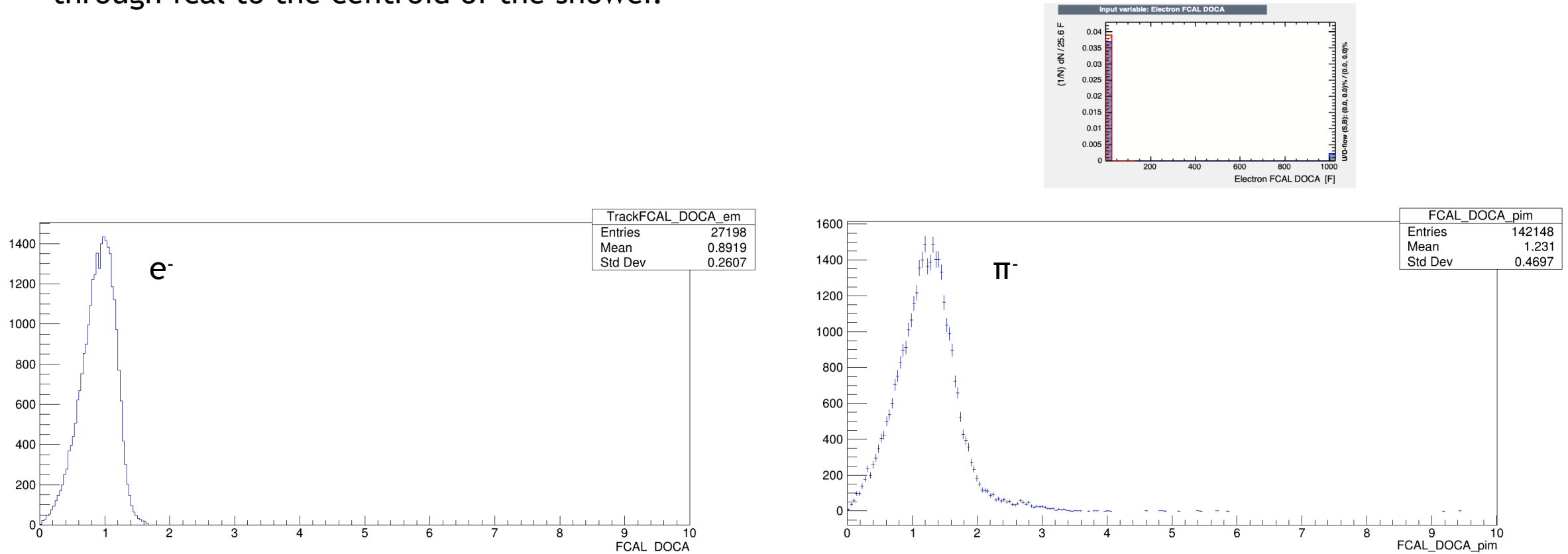
VARIABLE 3: FCAL DOCA

DOCA is the distance of closest approach. It is the distance in centimeters from the projection of the track through FCAL to the centroid of the shower. Tracks with no shower are given DOCA of 1000.



VARIABLE 3: FCAL DOCA

DOCA is the distance of closest approach. It is the distance in centimeters from the projection of the track through fcal to the centroid of the shower.

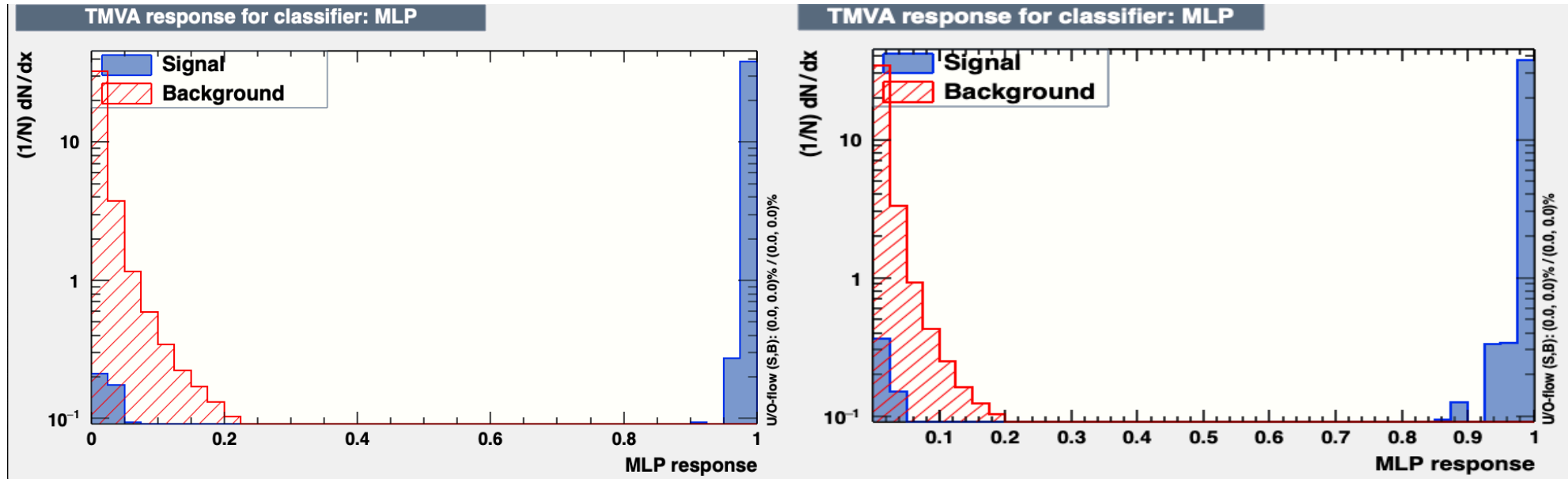


TWO SINGLE-TRACK NEURAL NETS OR ONE TWO-TRACK NEURAL NET?

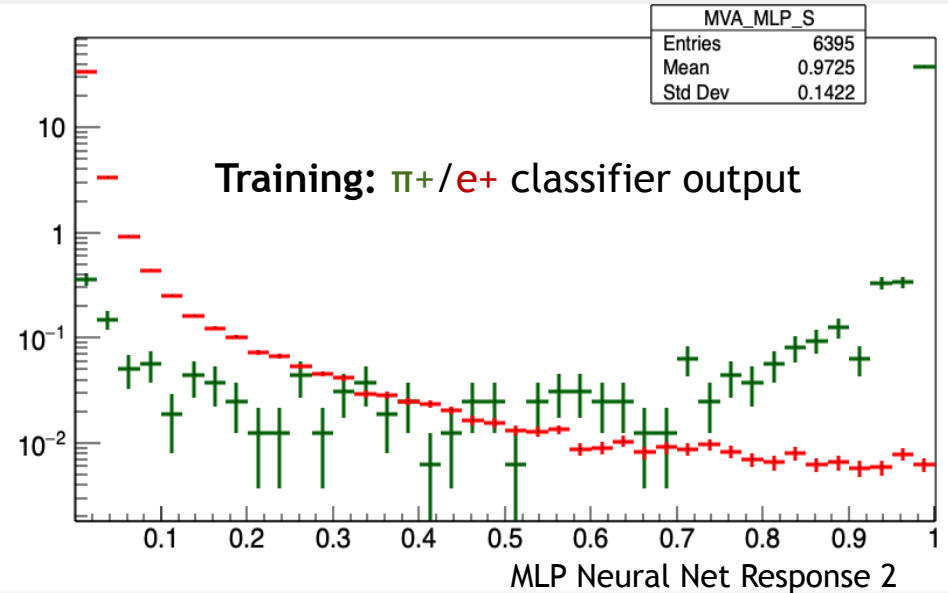
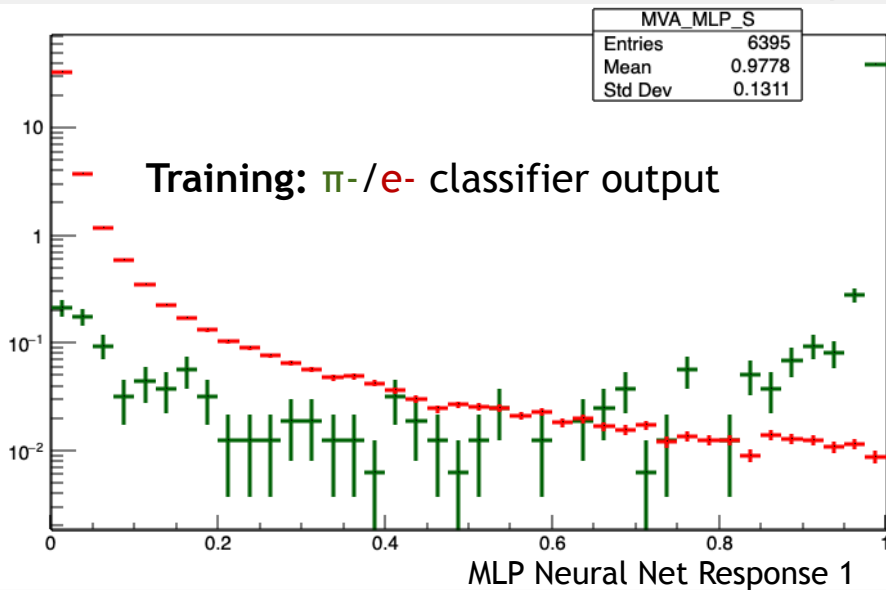
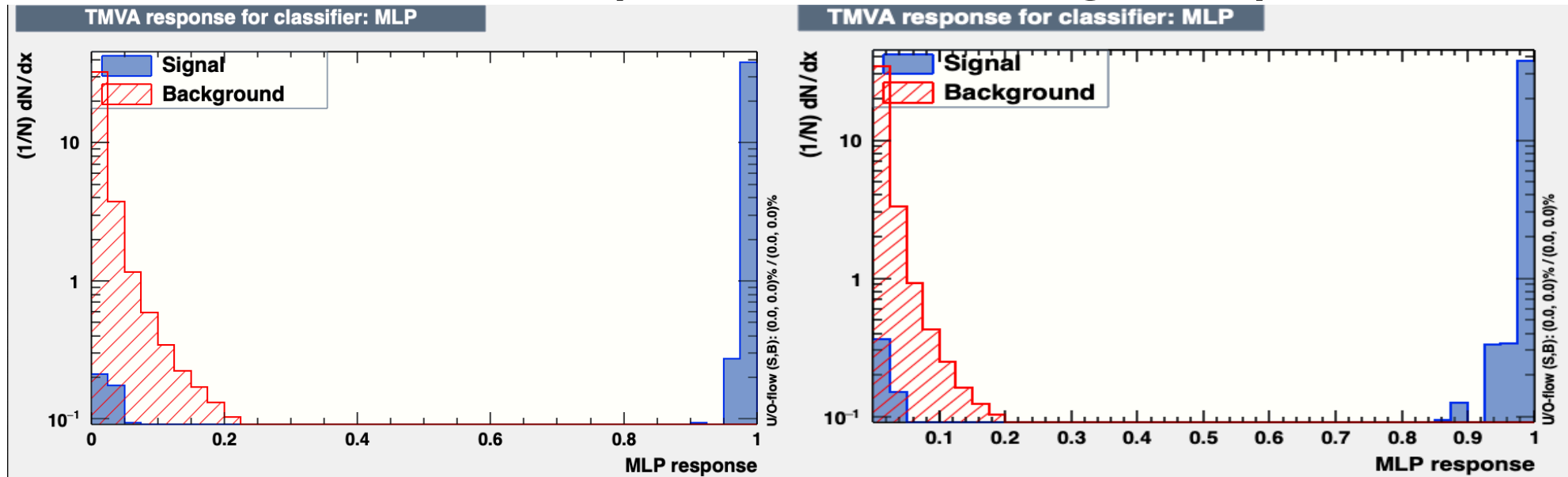
Training Methods

MLP, BDT, MLPBNN, LD

Classifier Outputs for Training Samples



Classifier Outputs for Training Samples



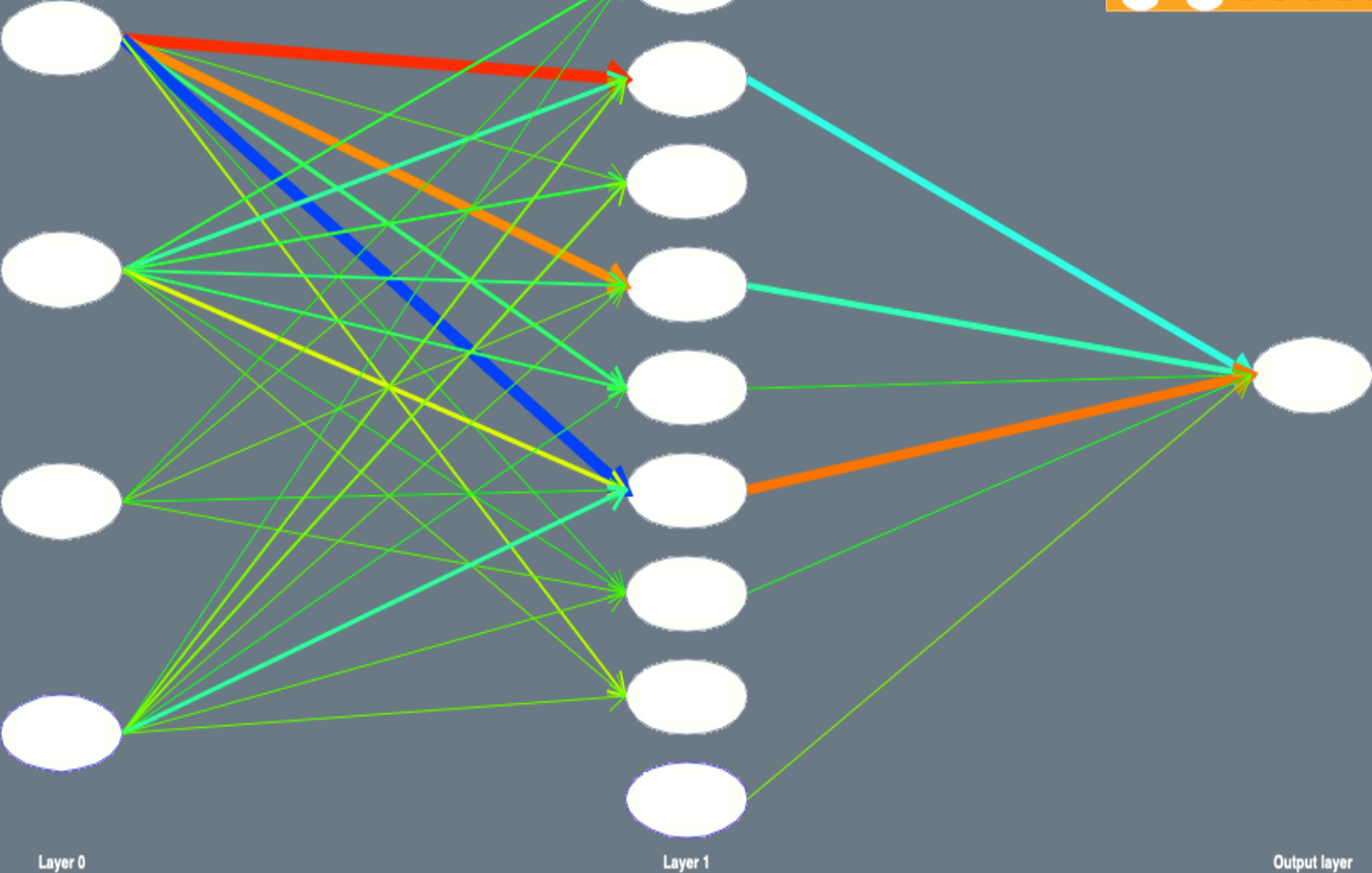
Bottom graphics plot the same data as above, but values less than $10e^{-1}$.

Electron FCAL Energy/KinFit momentum magnitude :

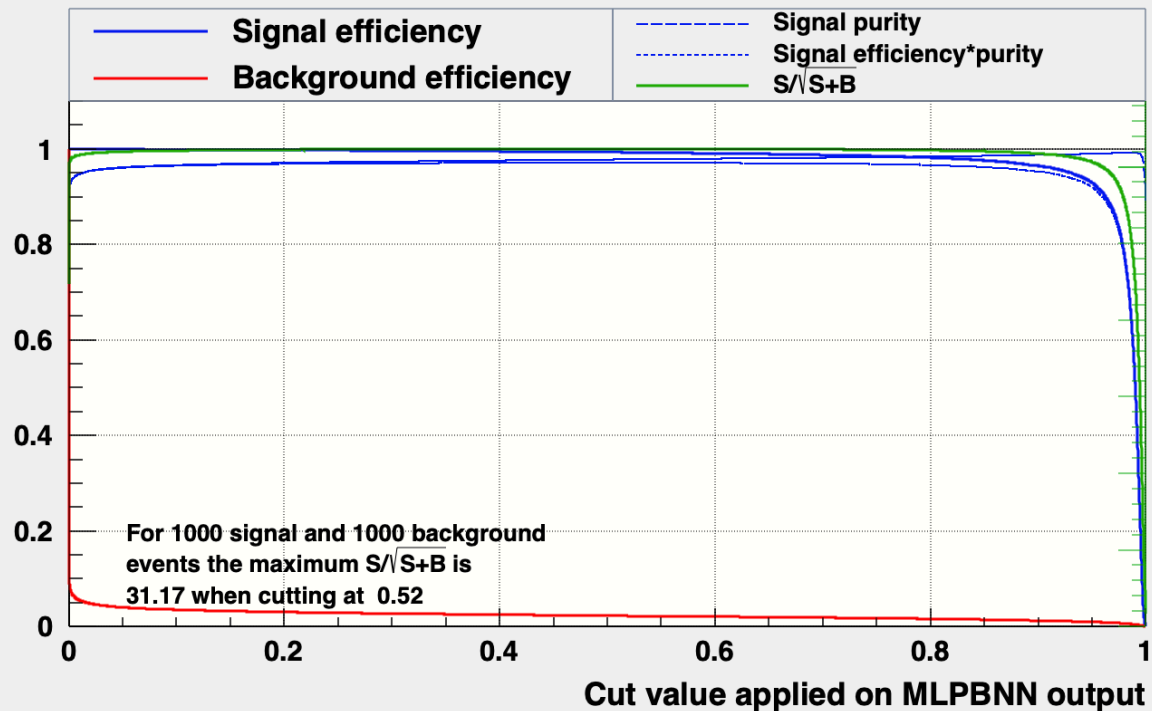
Electron FCAL DOCA :

Electron E9/E25 shower ratio :

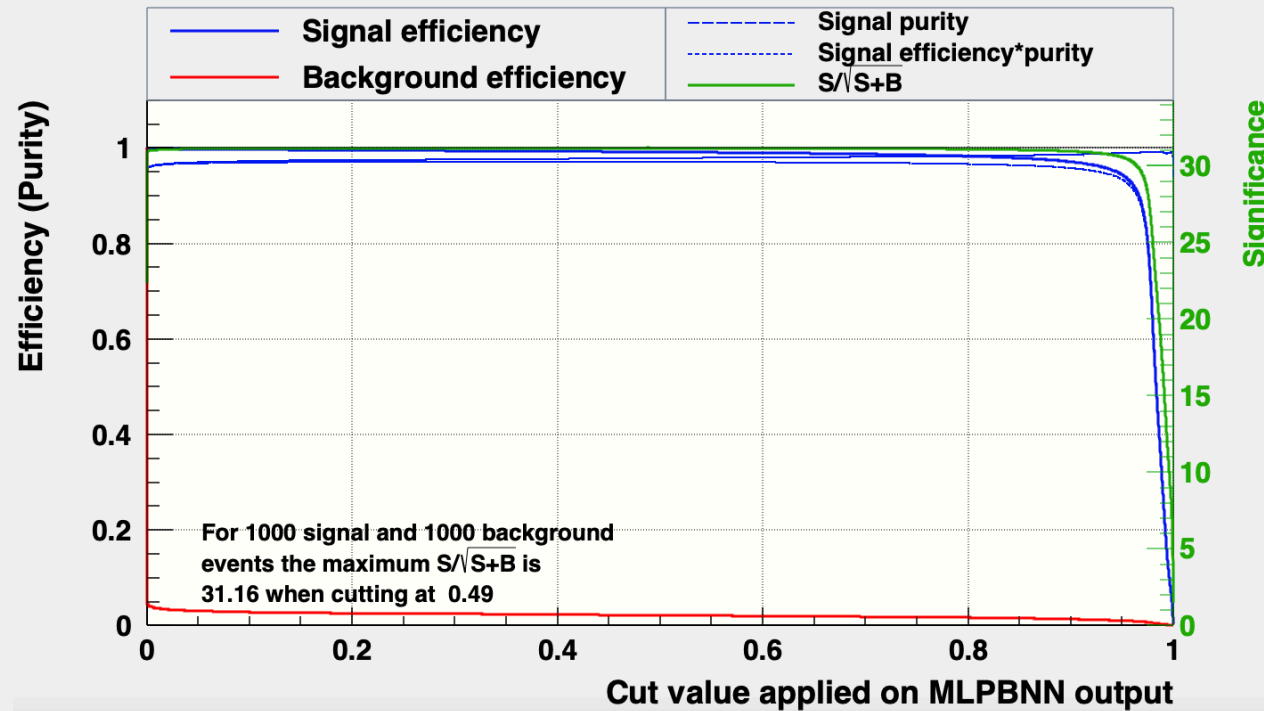
Bias node :



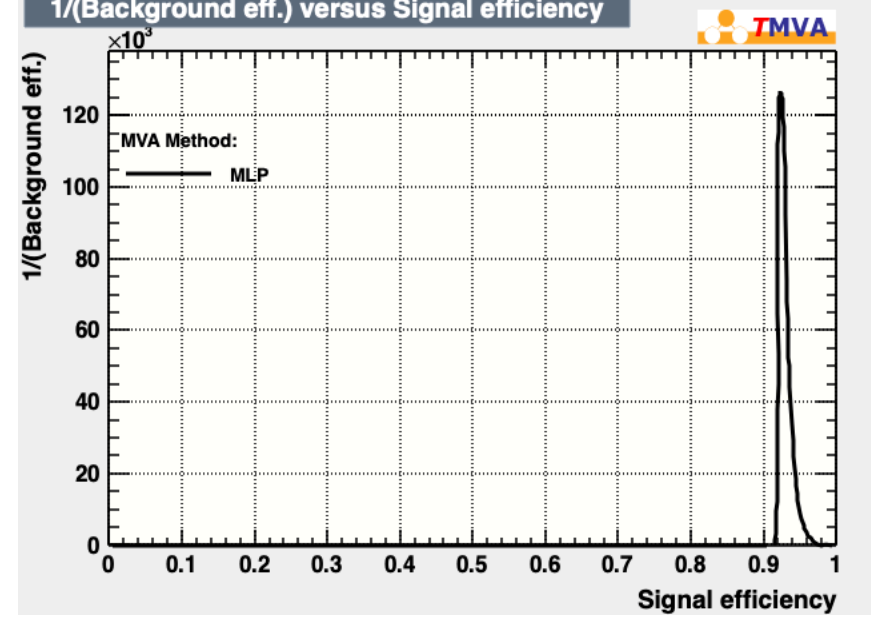
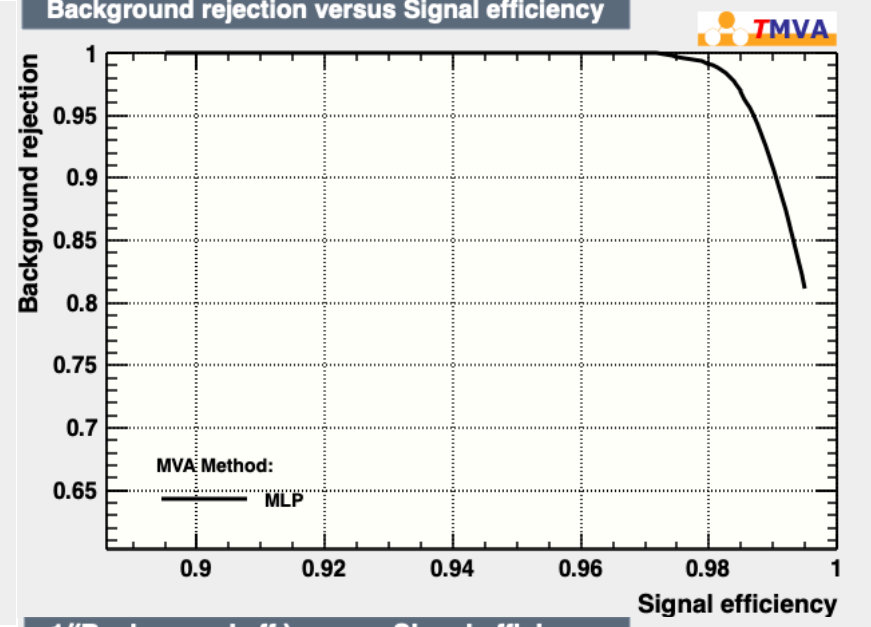
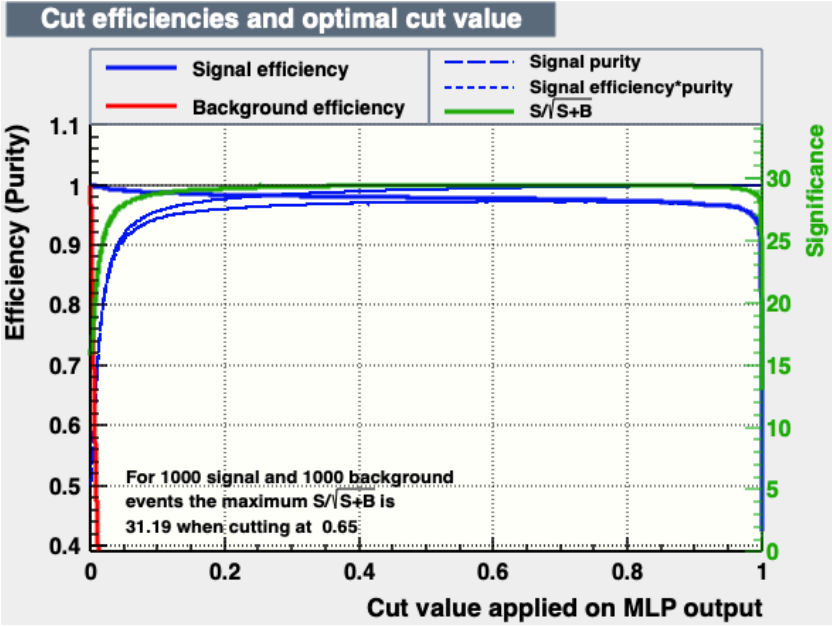
Cut efficiencies and optimal cut value



Cut efficiencies and optimal cut value

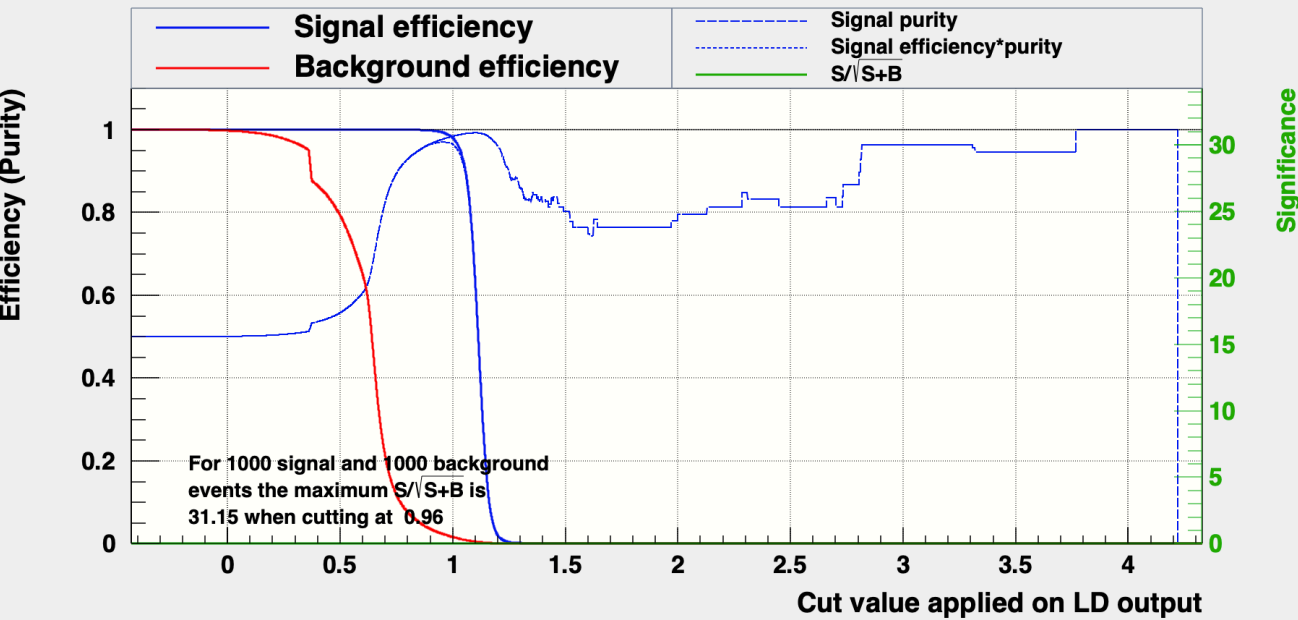


DIRC IN

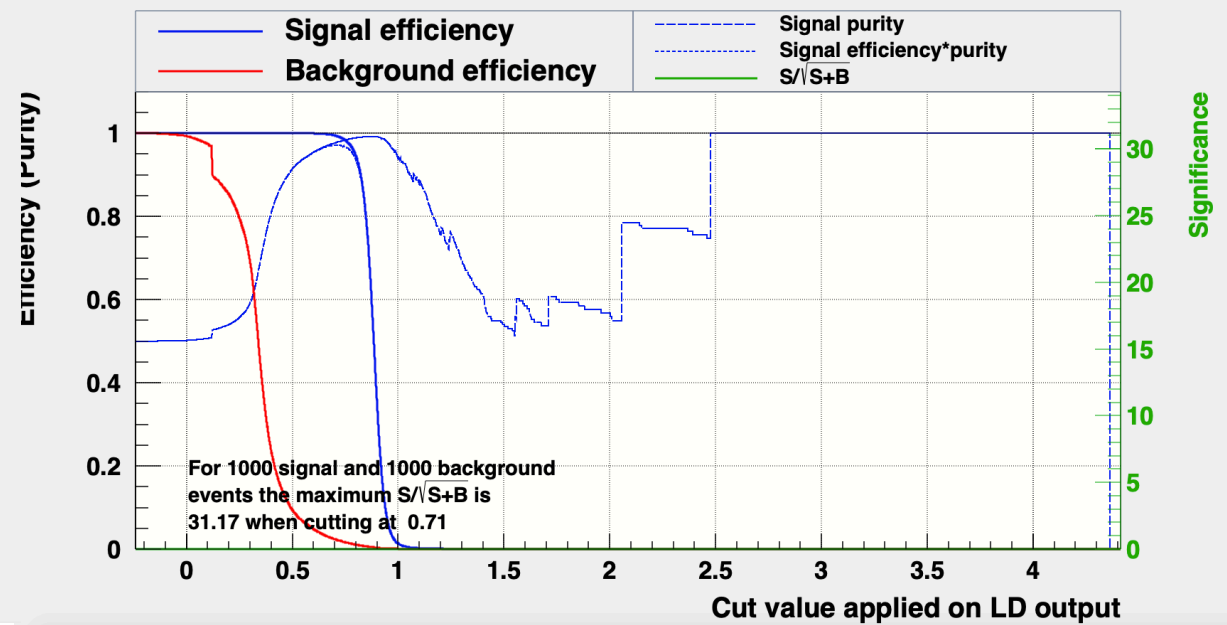


Old ROC Curves/DIRC study

Cut efficiencies and optimal cut value

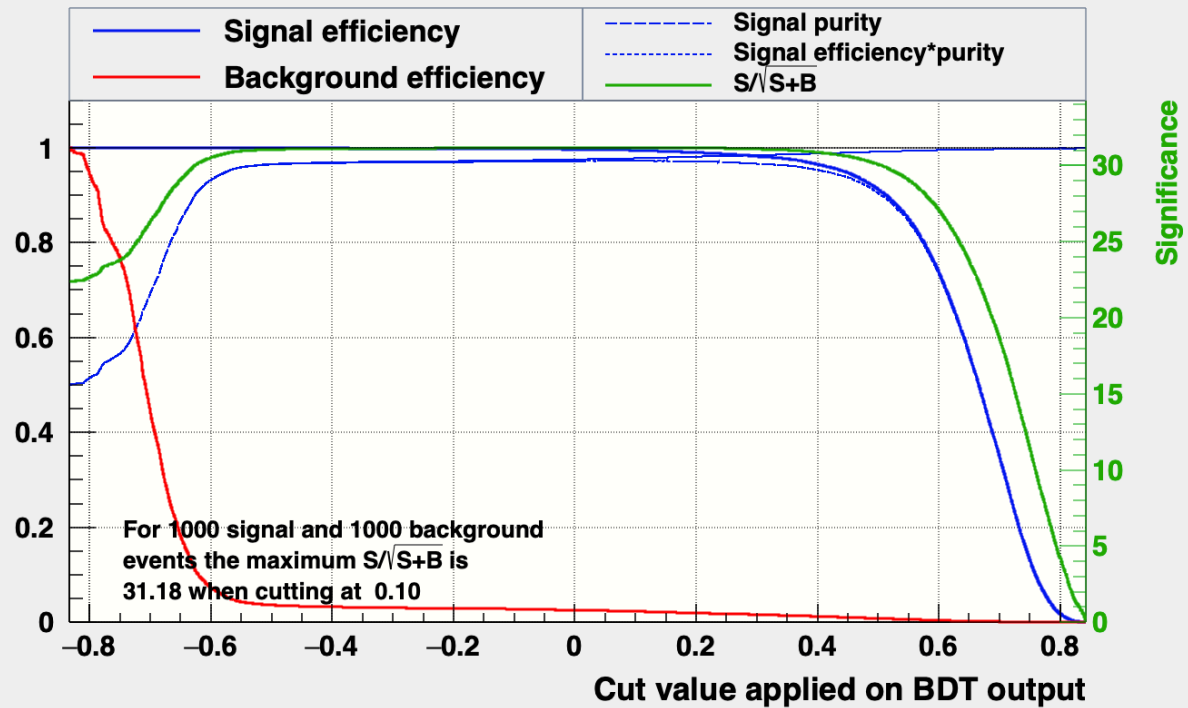


Cut efficiencies and optimal cut value

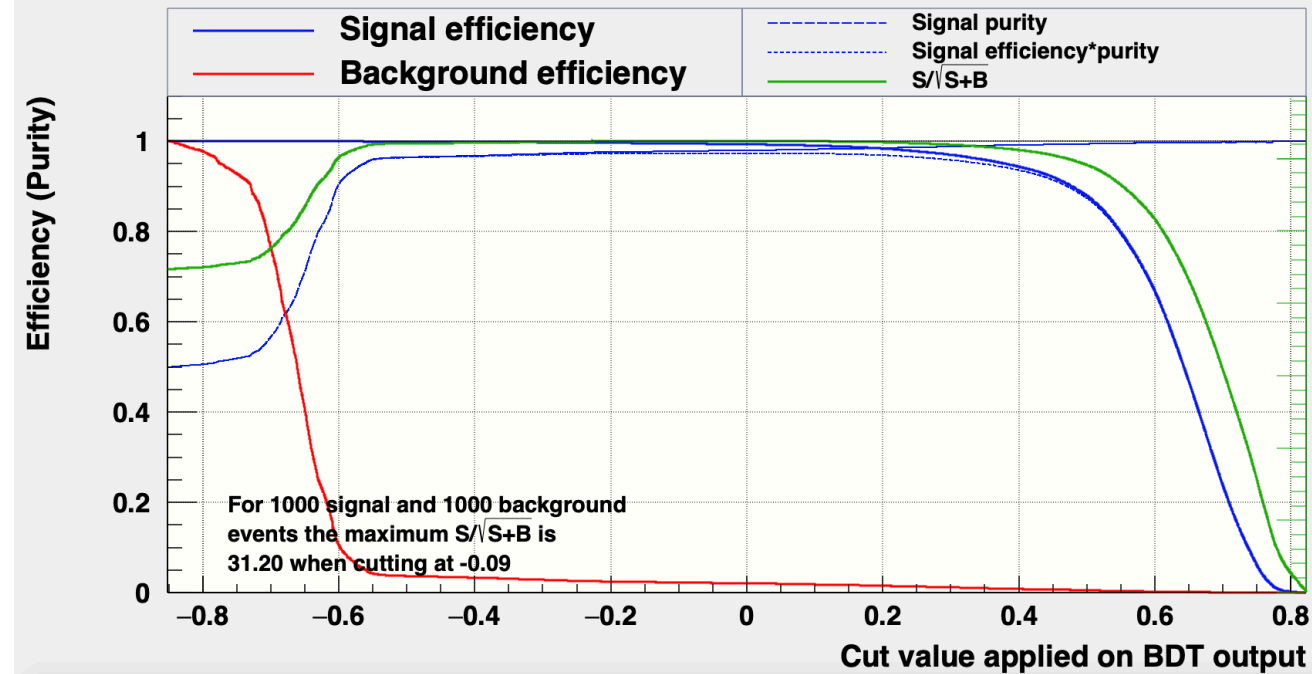


DIRC IN

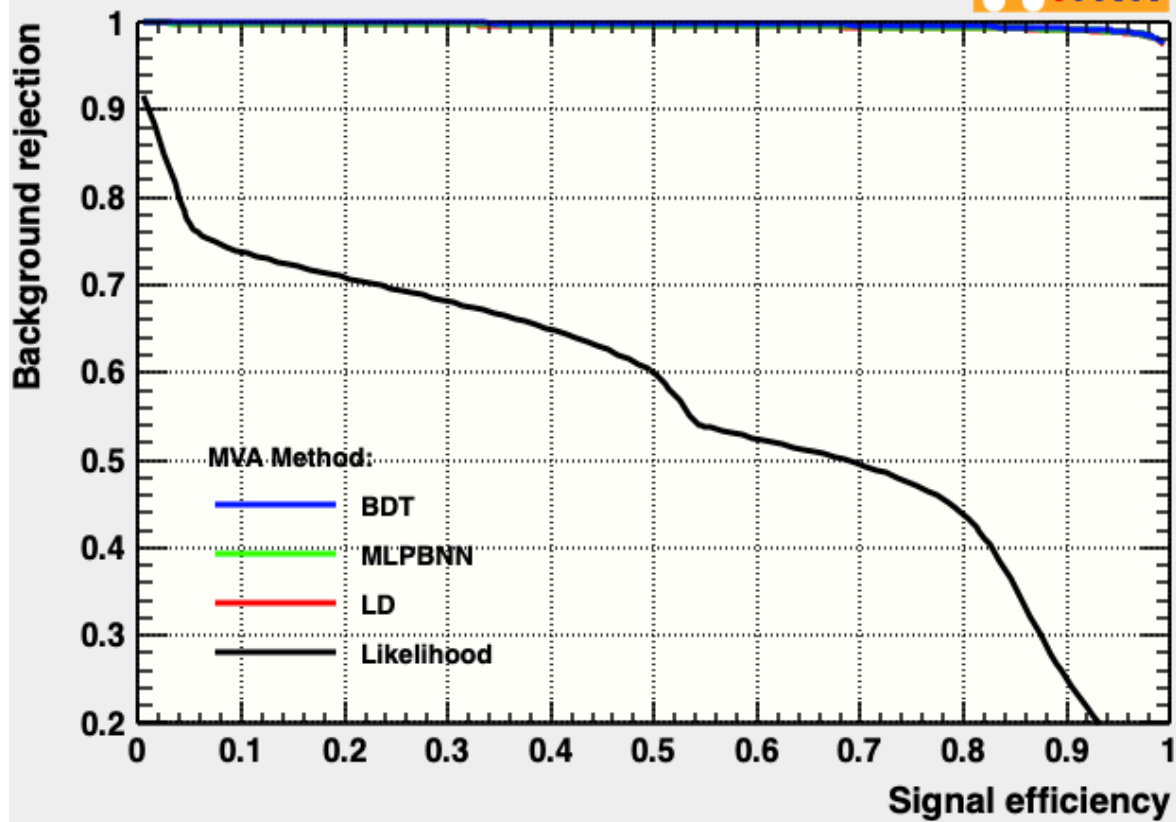
Cut efficiencies and optimal cut value



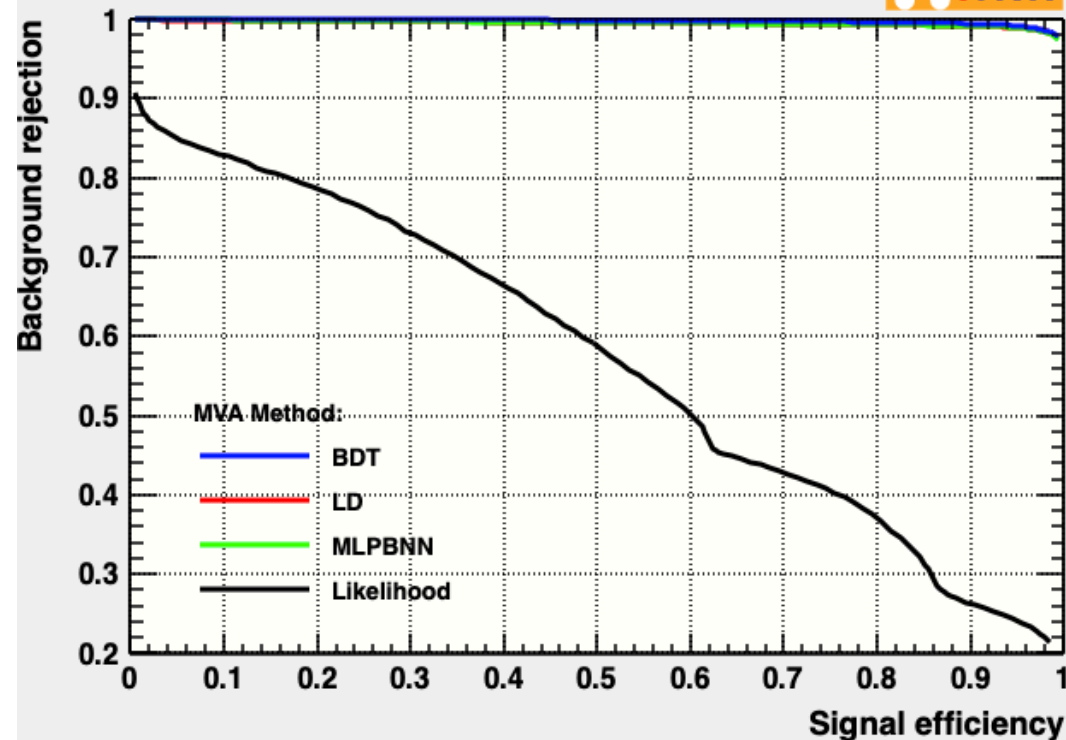
Cut efficiencies and optimal cut value

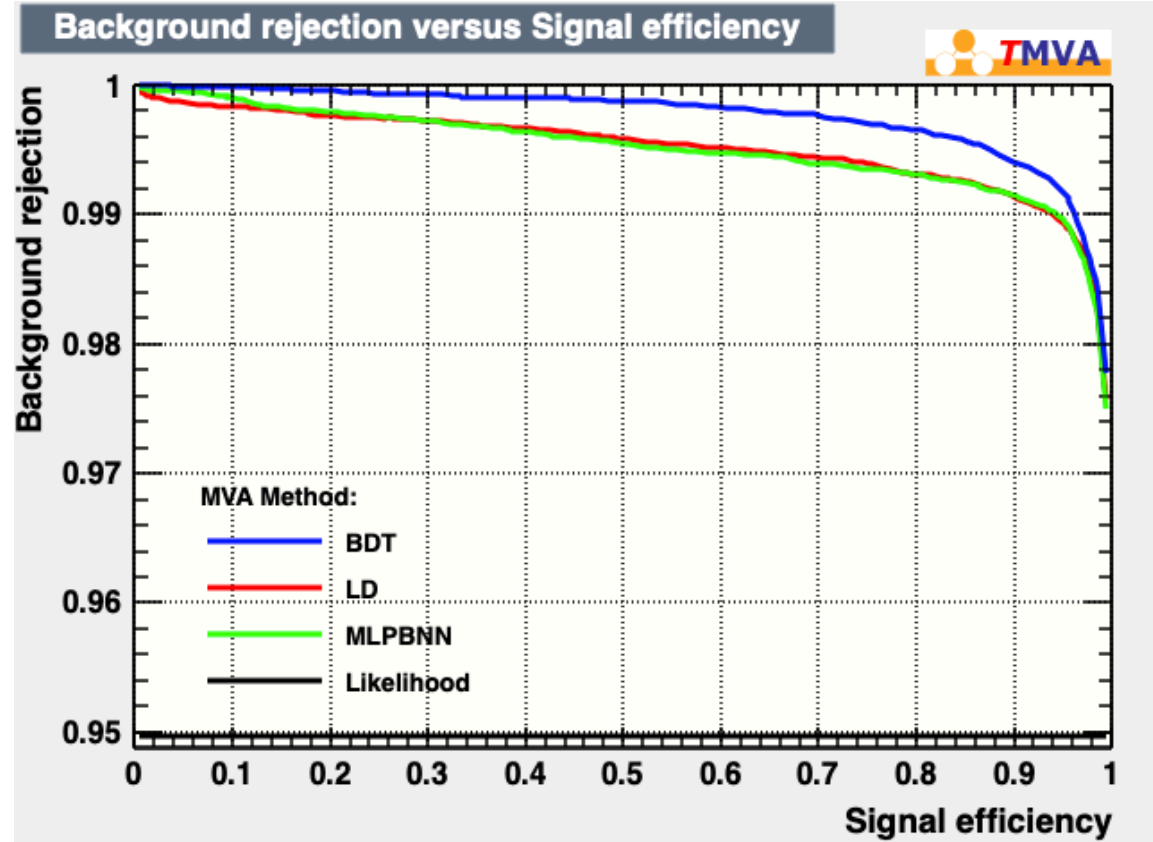
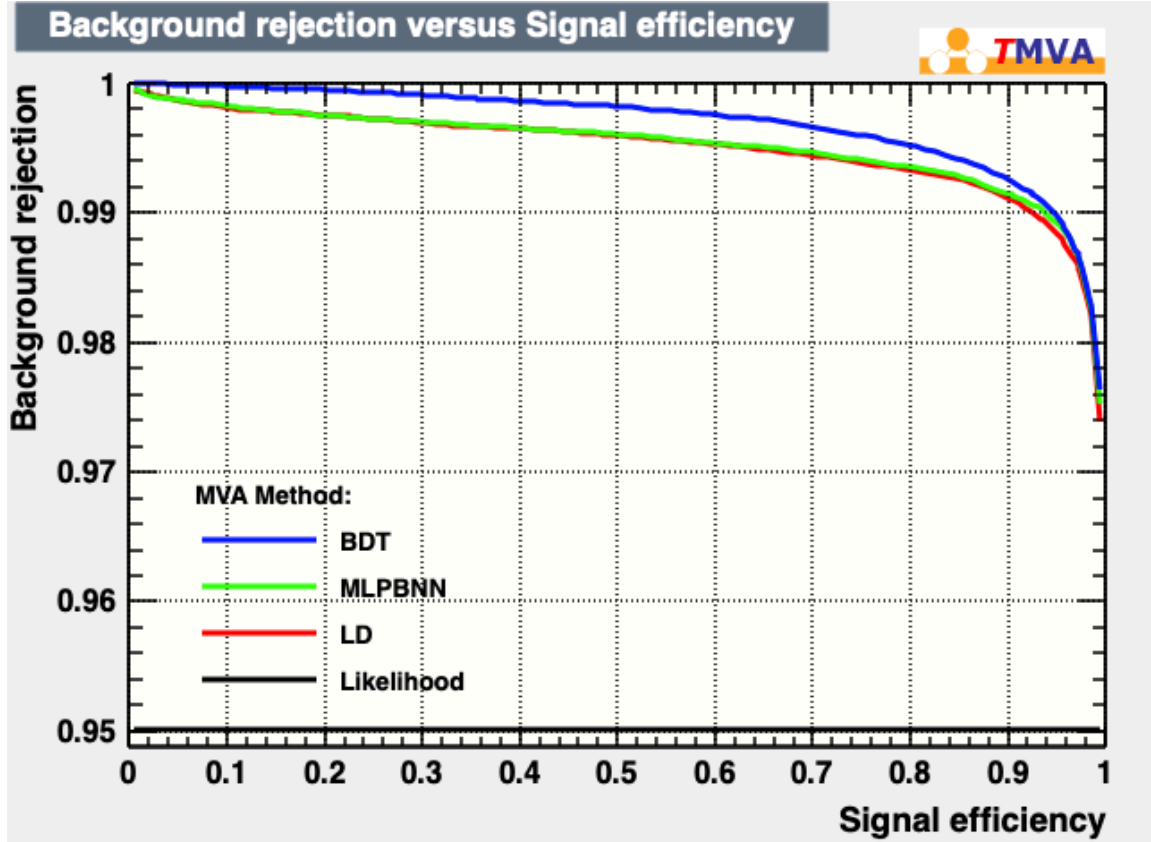


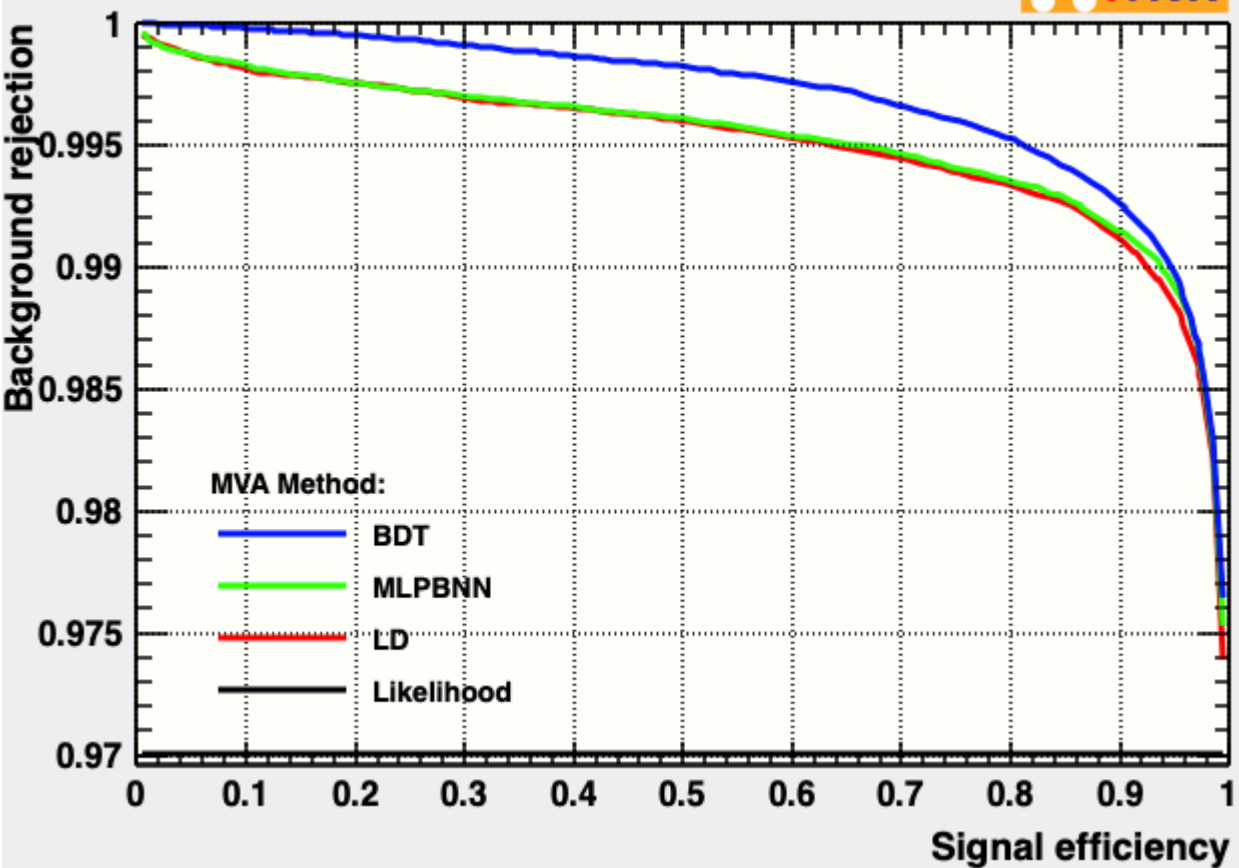
Background rejection versus Signal efficiency



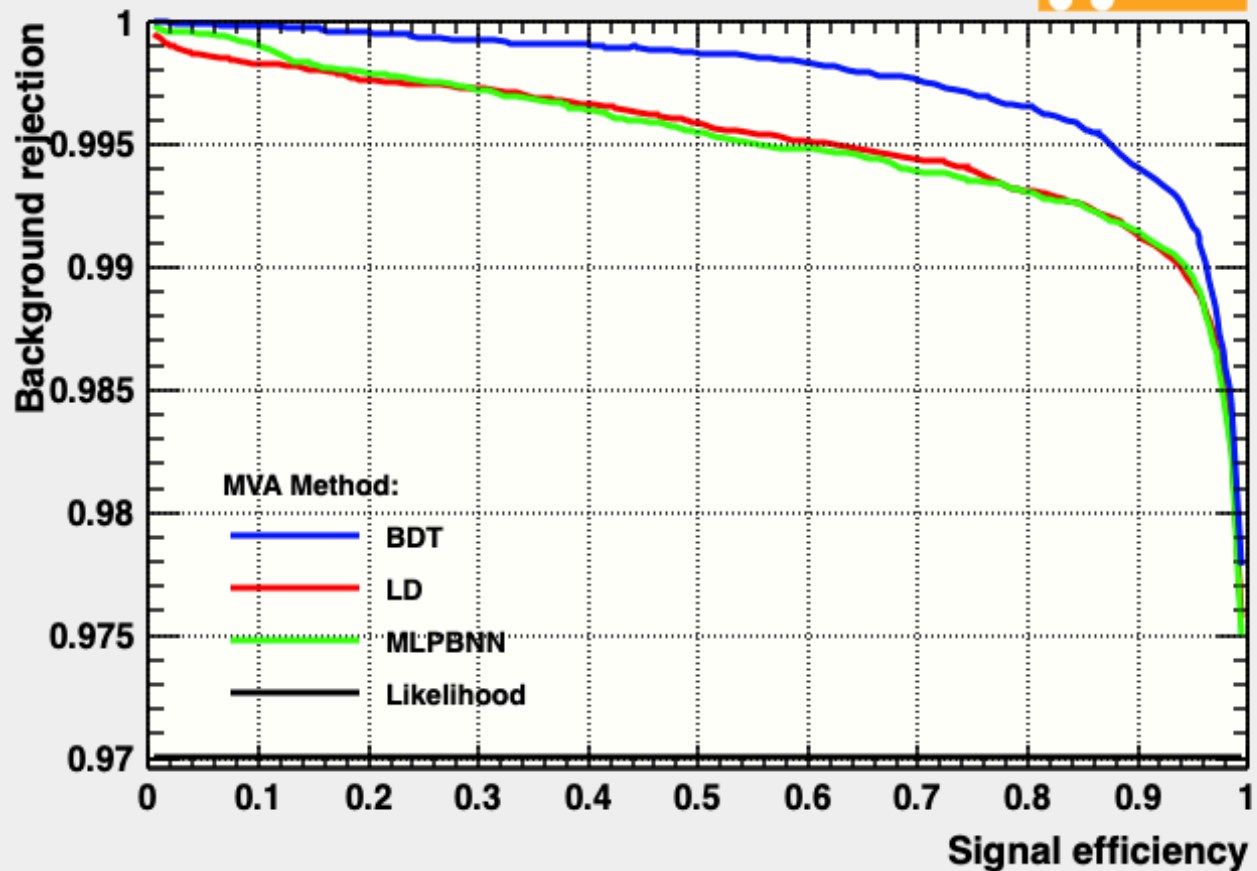
Background rejection versus Signal efficiency





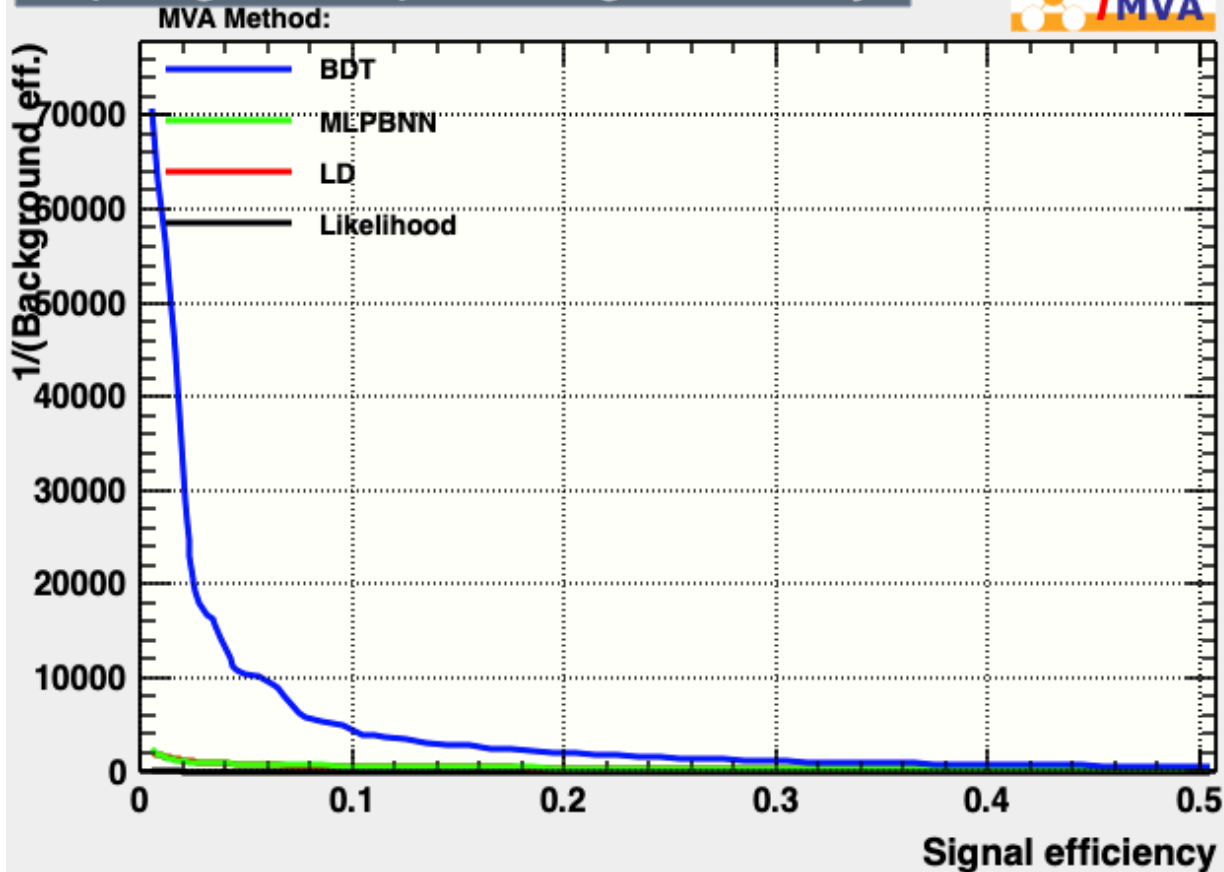


DIRC OUT



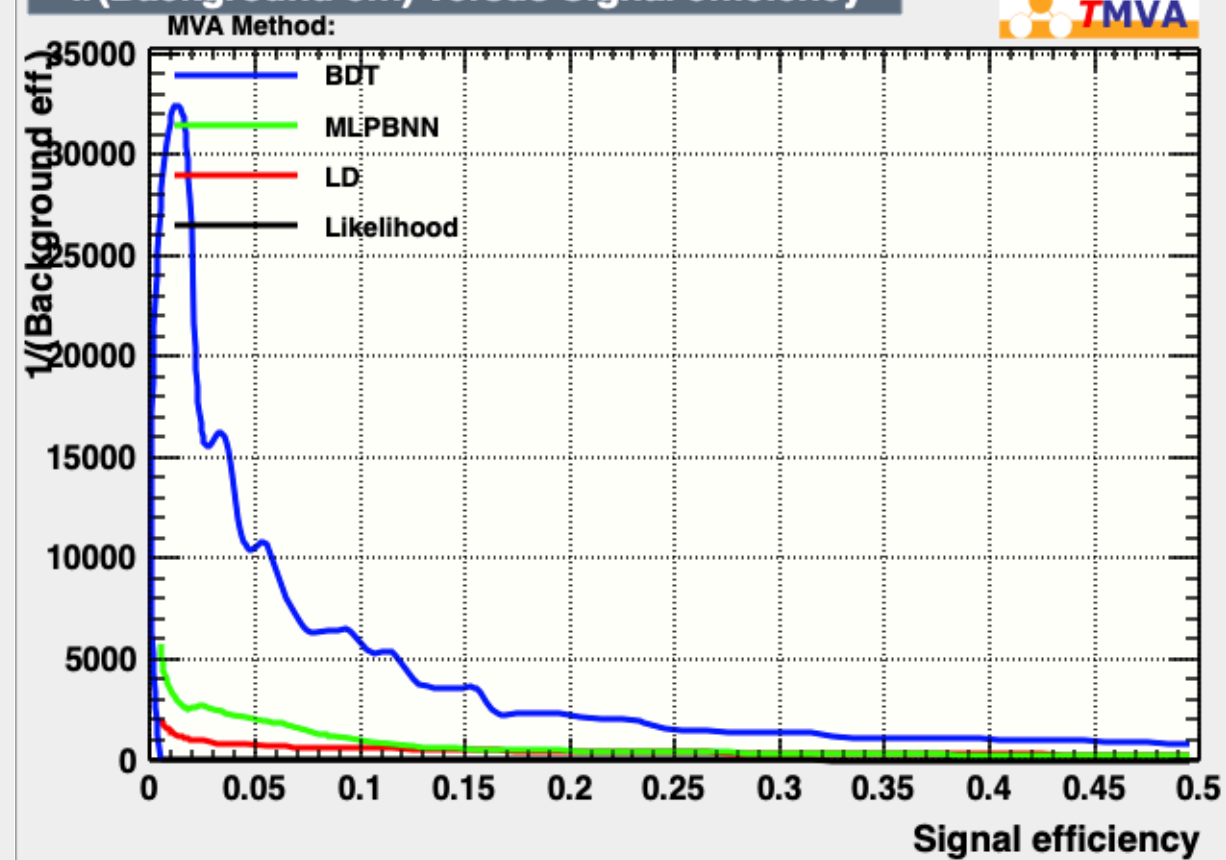
DIRC IN

1/(Background eff.) versus Signal efficiency



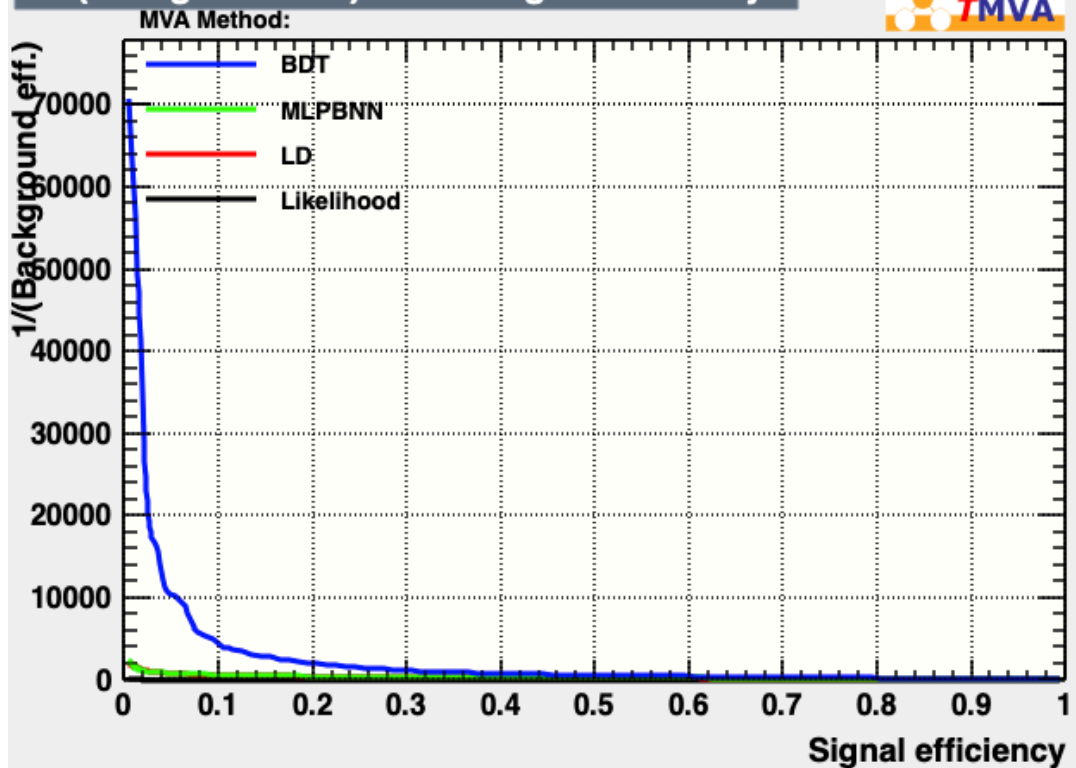
DIRC OUT

1/(Background eff.) versus Signal efficiency



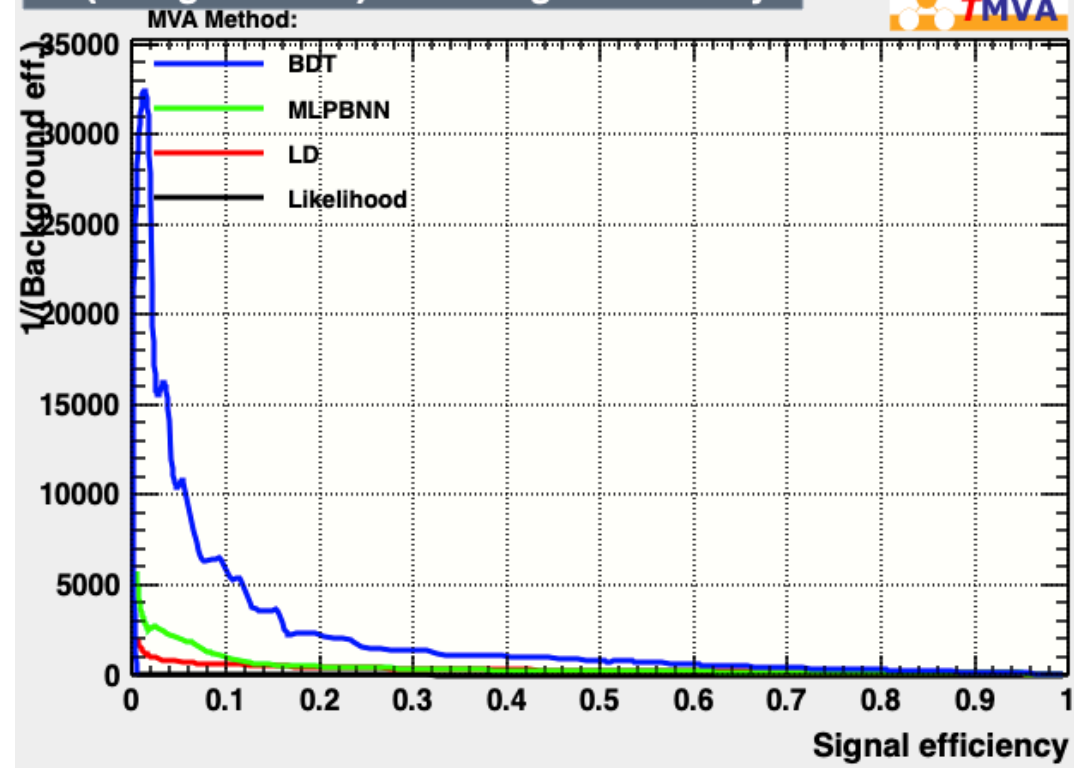
DIRC IN

1/(Background eff.) versus Signal efficiency



DIRC OUT

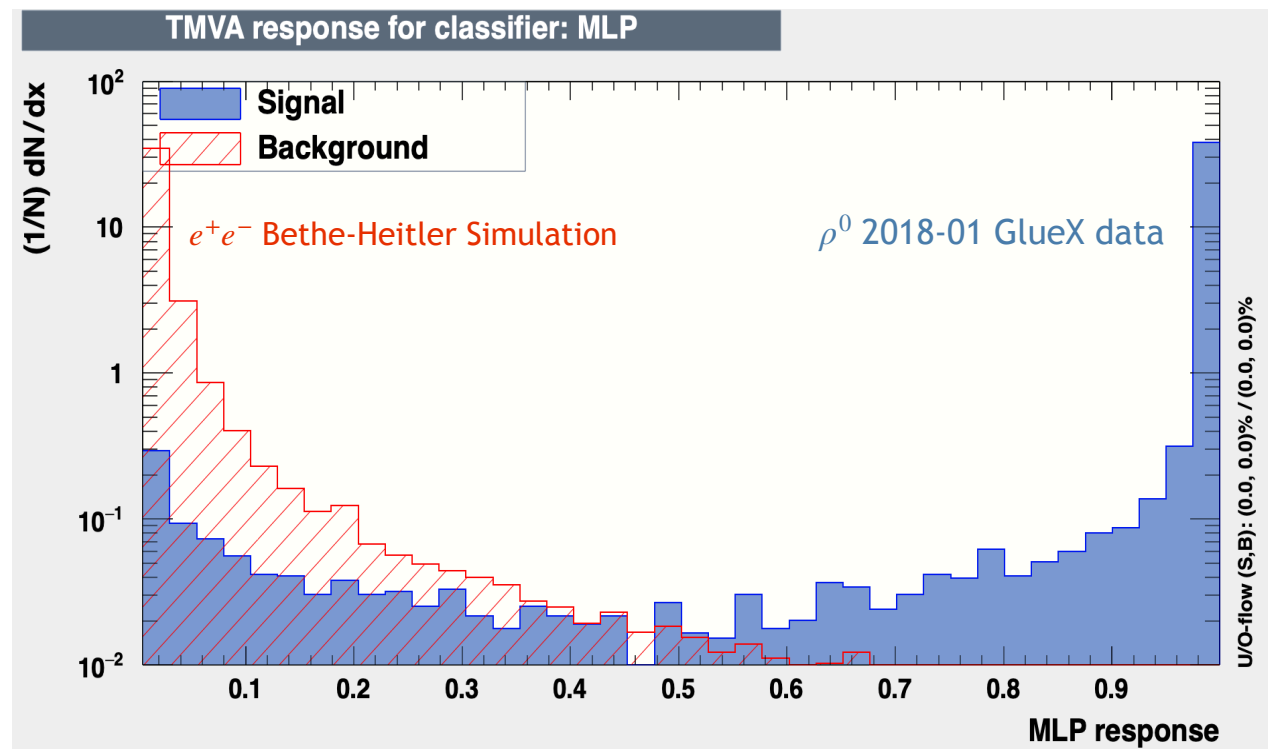
1/(Background eff.) versus Signal efficiency



DIRC IN

Extreme Neural Net Response Regions

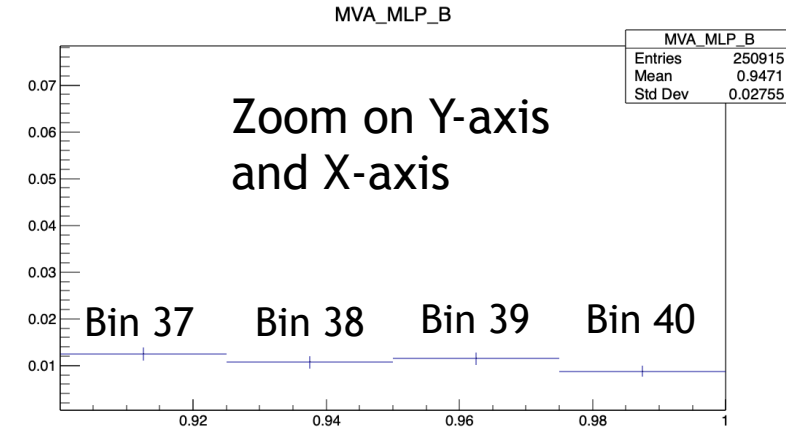
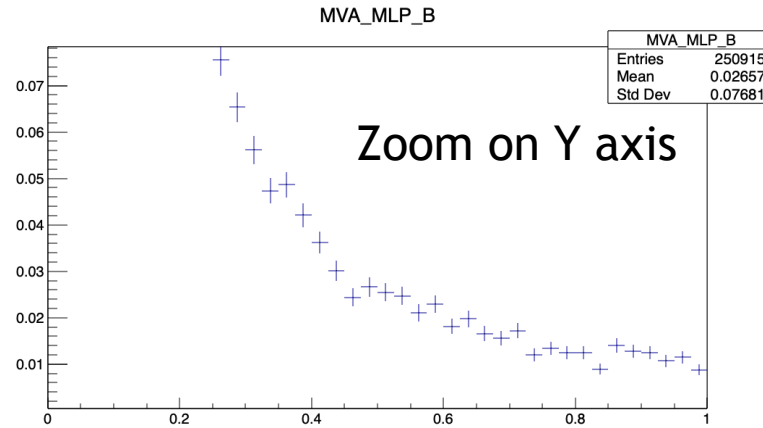
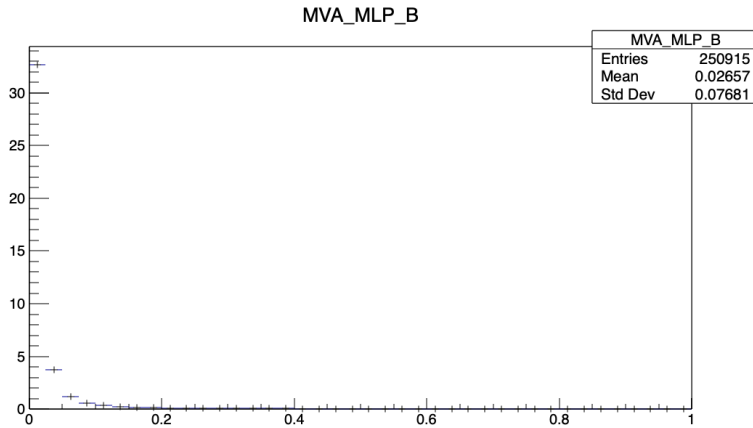
Pions identifying as electrons. How many misclassified electrons would appear in a given interval



Suppose we wanted to only look at pions with a NN response above 0.9. In the training sample, do we have perfect separation from electrons?

If we were to do the π^0 study again, where we classify the $\pi^0 \rightarrow \gamma e^+ e^-$ peak, selecting for pions, how many misclassified electrons could we expect to see above 0.9?

Simulated electrons (used in training) MLP Neural net response values.



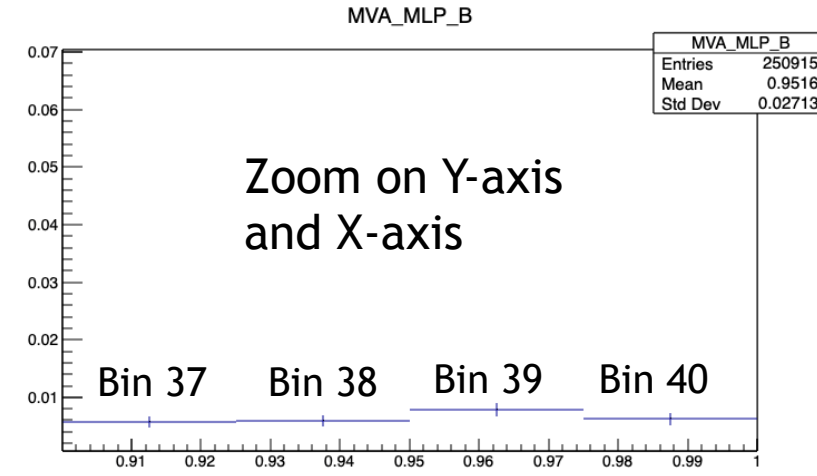
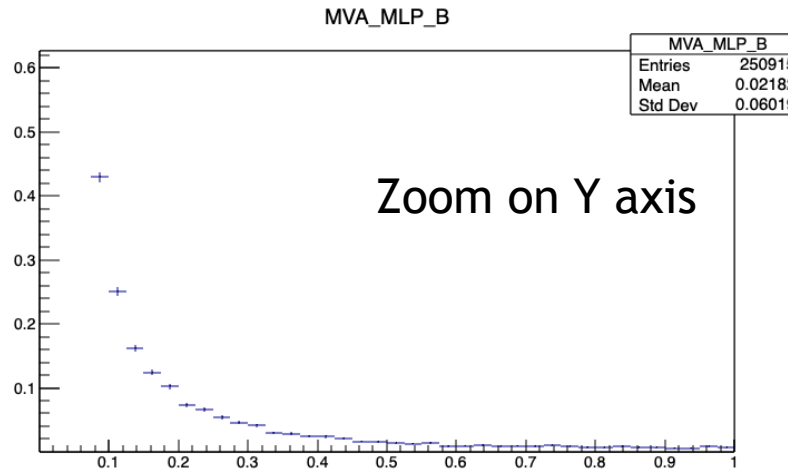
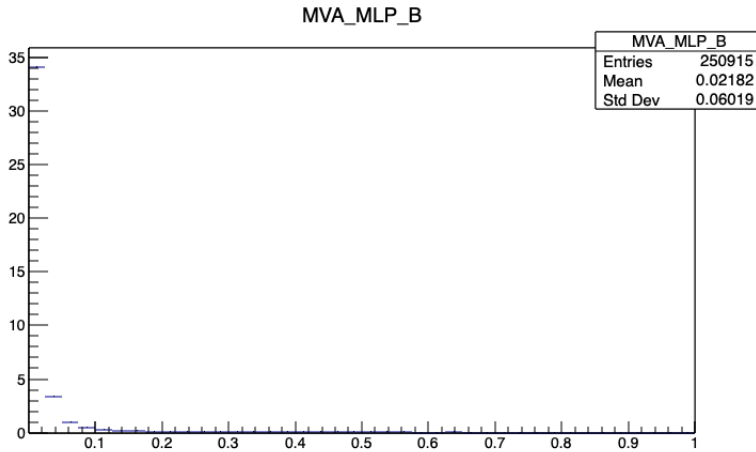
There are 40 bins total.

$$\int_1^{40} N_{BH}(x)dx = 39.999664$$

$$\frac{\int_{37}^{40} N_{BH}(x)dx}{\int_1^{40} N_{BH}(x)dx} = \frac{0.030926548}{39.999664} = 0.0010840325$$

Likelihood of e^- track getting misclassified as $\pi^- = 0.1\%$

Simulated positrons (used in training) MLP Neural net response values.

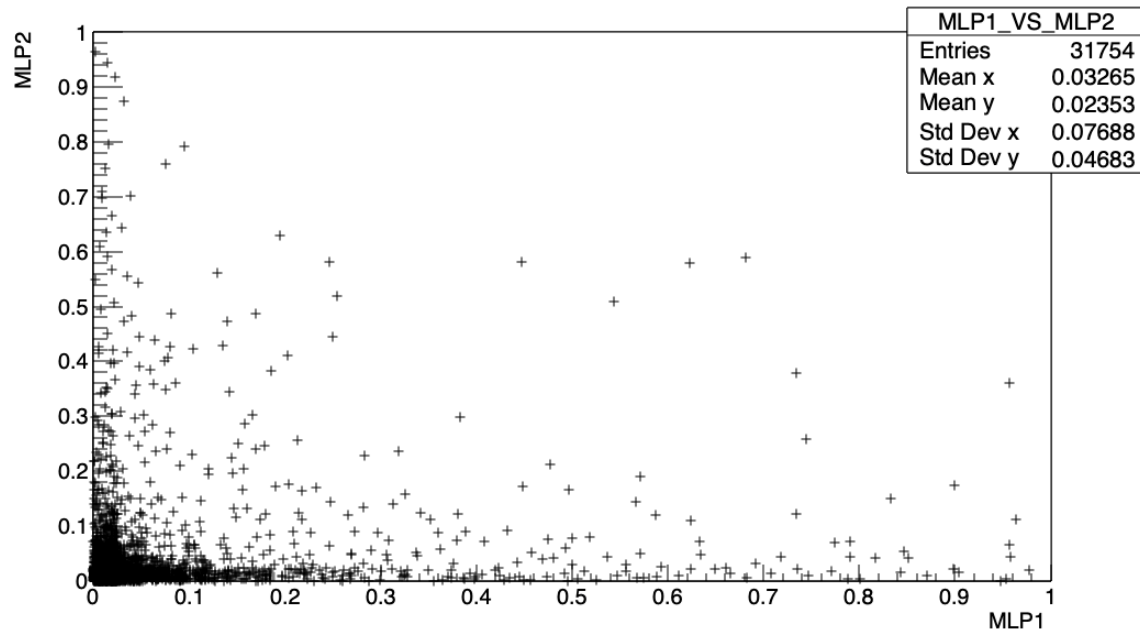


$$\frac{\int_{37}^{40} N_{BH}(x)dx}{\int_1^{40} N_{BH}(x)dx} = \frac{0.025666261}{40.000309} = 0.00064165652$$

Likelihood of e^- track getting misclassified as $\pi^- = 0.1\%$
Likelihood of e^+ track getting misclassified as $\pi^+ = 0.06\%$

$$0.1\% \times 0.06\% = 0.006\%$$

Classifying pi0->ge+e-

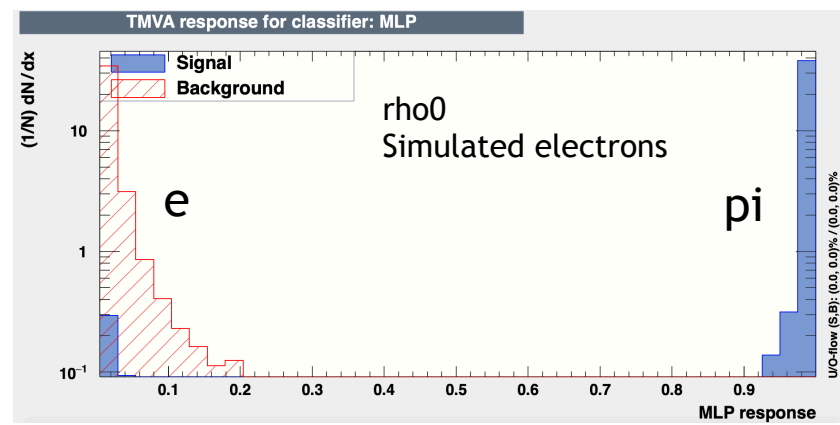


Selecting for Pions		
NN cut	omega->pi0pi+pi- (%)	pi0->ge+e- (%)
NN > 0.9	89.27888272	0
NN > 0.6	92.98702496	0
NN > 0.55	93.35576502	0.006298419097
NN > 0.4	94.32370768	0.01259683819

LIKELIHOOD OF MISCLASSIFICATION AT NN > 0.9 WAS
 $0.1\% \times 0.06\% = 0.006\%$
 ZERO PI0 events surviving does not contradict this prediction.

Can actually set NN response cut for pions much lower than I originally thought.

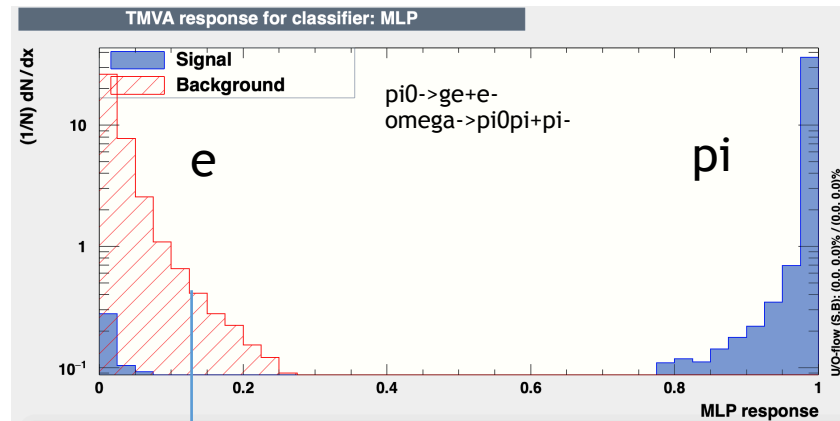
Pions have a pileup under electron peak in two separate training sample sources
(BH MC/rho vs omega/pi0)



2. Low NN response PIONS

a.) Are the number of events of the low NN response pions the same between the two training sample sources?

b.) Contamination?
 Physics?



LET'S CALL EVERYTHING BELOW BIN 5 THE "LOW NN RESPONSE REGION" OR NNR = 0.12

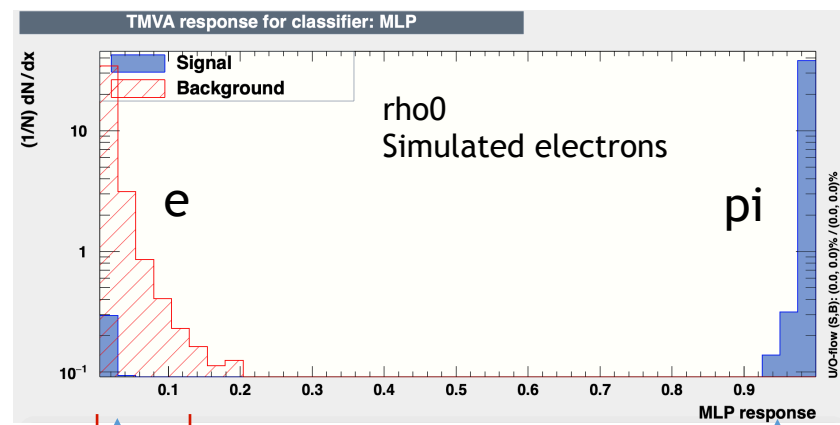
a.) Are the number of events of the low NN response pions the same between the two training sample sources?

Integral procedure:
MVA response histograms have **40 bins**.

Background peak integral: bins 1 to 5
Signal peak integral: bins 31 to 40

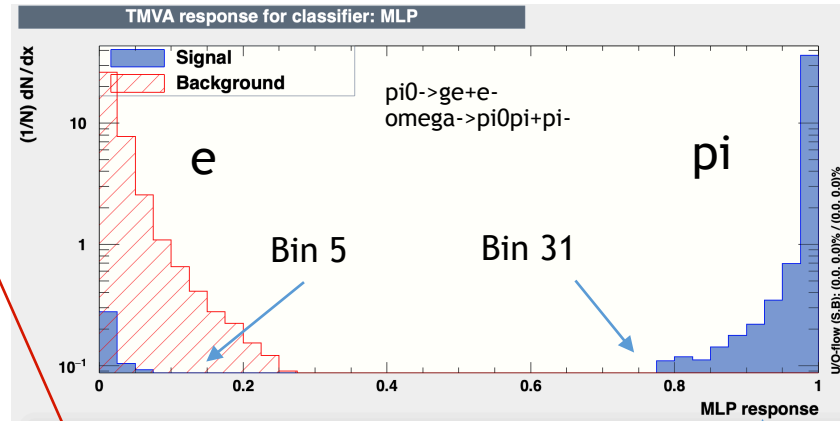
I keep the bounds of integration the same for both rho0 and omega(782)

LET'S CALL EVERYTHING BELOW BIN 5 THE "LOW NN RESPONSE REGION" OR NNR = 0.12



Background peak

Signal peak



Background peak

Signal peak

$$\frac{\int_1^5 N_{\rho_0}(x)dx}{\int_{31}^{40} N_{\rho_0}(x)dx} = \frac{0.76404053}{39.046492} = 0.019567456$$

1000*.019 = 19 events +/- 4 events
(sqrt(19) ~ 4, statistics)

$$\frac{\int_1^5 N_{\omega(782)}(x)dx}{\int_{31}^{40} N_{\omega(782)}(x)dx} = \frac{0.67999367}{38.519641} = 0.017653167$$

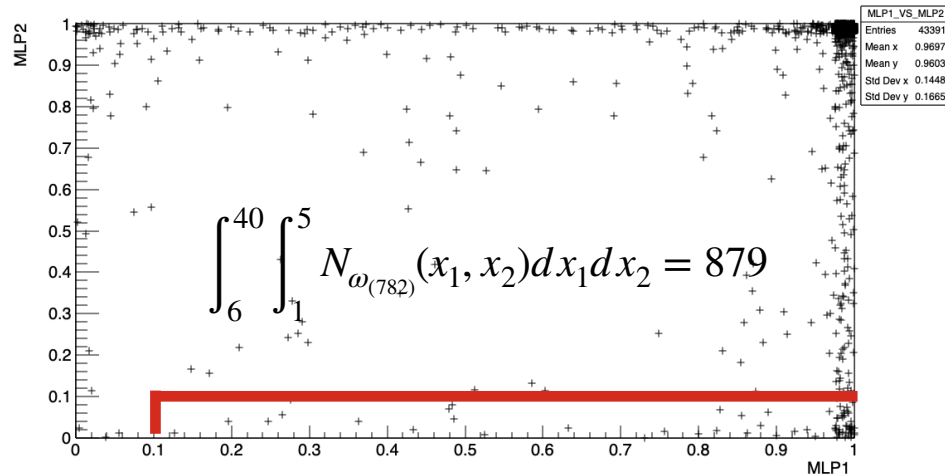
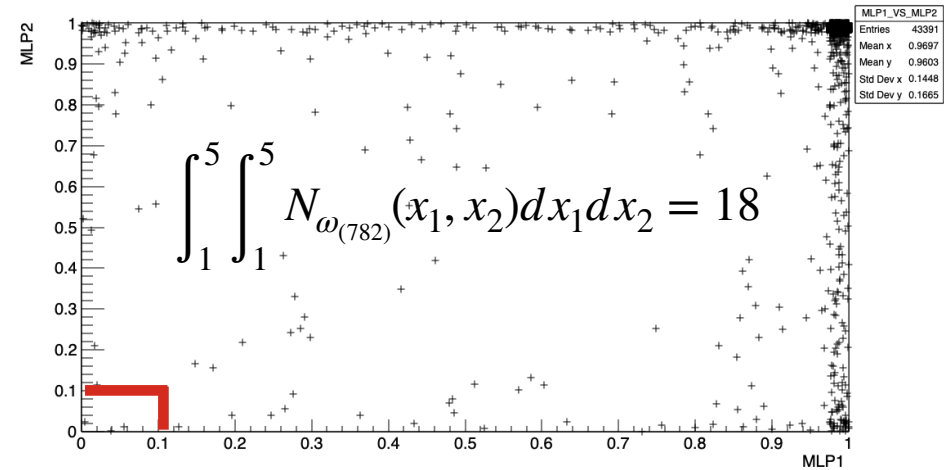
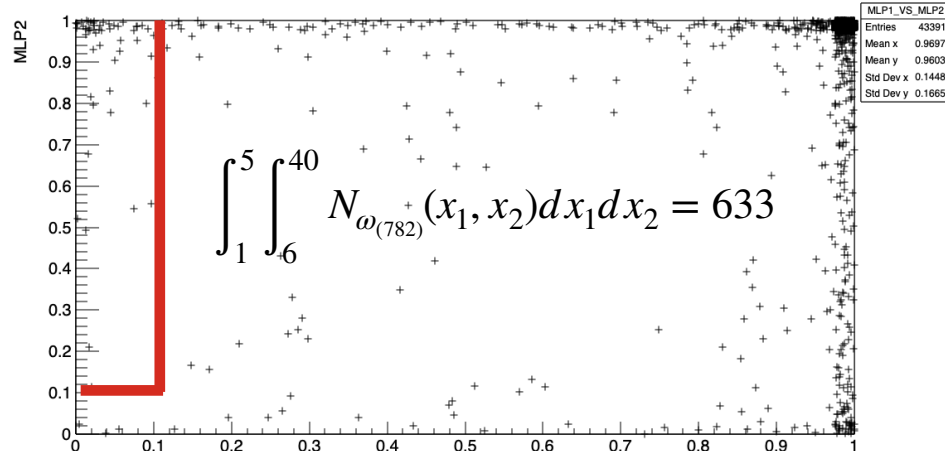
roughly 2% in both training methods

Conclusions

- There is no significant contamination in the rho0 training vs the omega(782) training.

Integration of 3 complementary regions: how many pion events have at least 1 track in the extreme $e+e-$ NN response territory?

Trained on simulated BH pairs and $\rho^0 \rightarrow \pi^+\pi^-$ events
 Classifying $\omega(782) \rightarrow \pi^0\pi^+\pi^-$ events

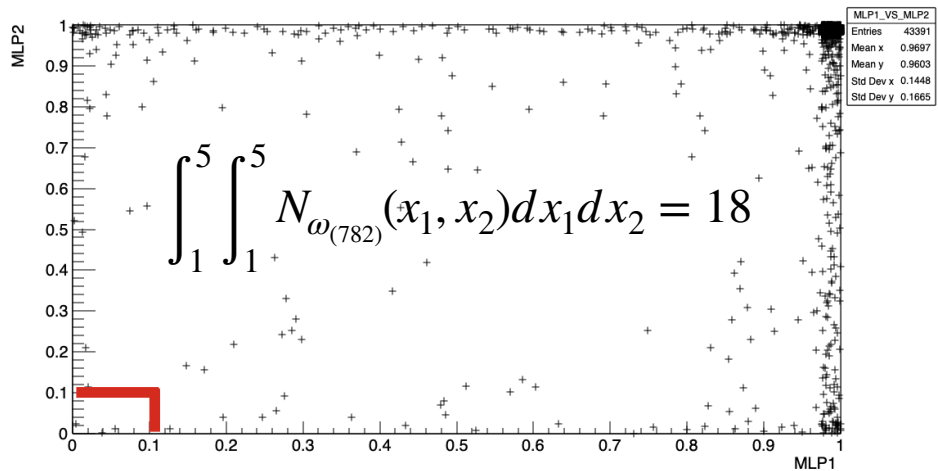


$$\frac{18 + 633 + 879}{43391} = \frac{1530}{43391} = 0.035$$

3.5% of events need to be explained.

3.5% of events need to be explained.

1. Double low NN response



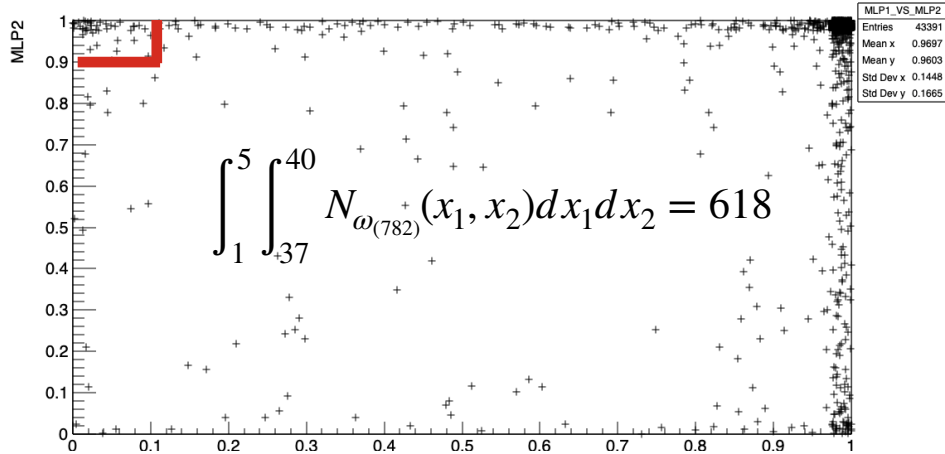
.04% is basically 2% of 2%. Could just be events where both events charge exchange reaction

0.04 % of $\omega(782) \rightarrow \pi^0 \pi^+ \pi^-$ events have both tracks with low NN response values.

Let's assume (for no good reason other than playing a game) that this is contamination. Now 3.46% events need to be accounted for.

3.46% of events need to be explained

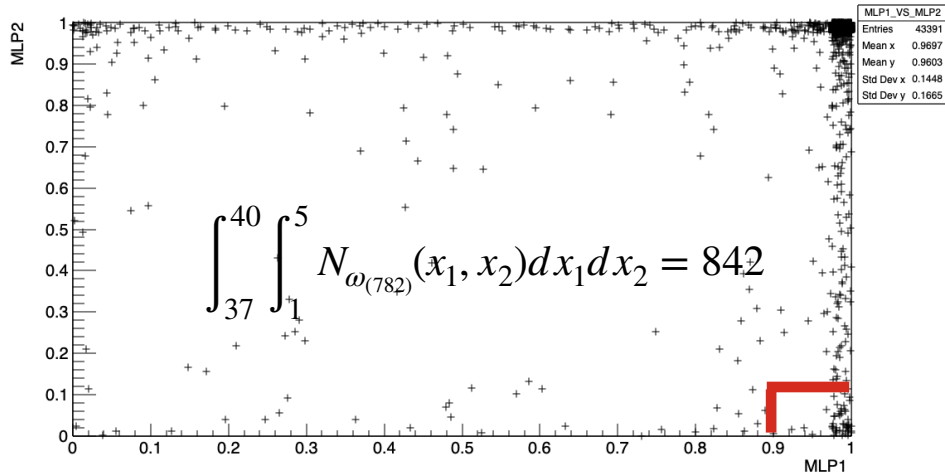
2. One high NN response, one low. (NN1 > 0.9, NN2 < 0.12)



$$\frac{618 + 842}{43391} = 0.033647531$$

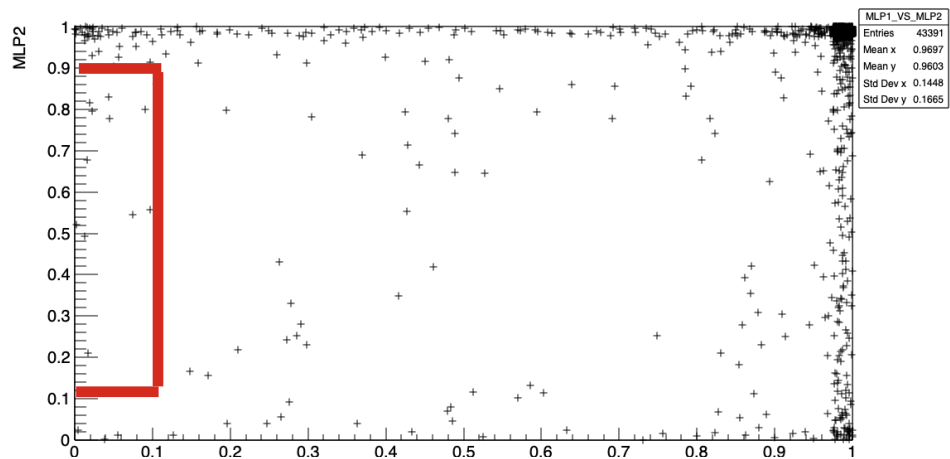
Let's assume (again, for no good reason)
3.3% of events have charge exchange reaction (π^+ or π^-)

Now 0.16% of events need to be accounted for.

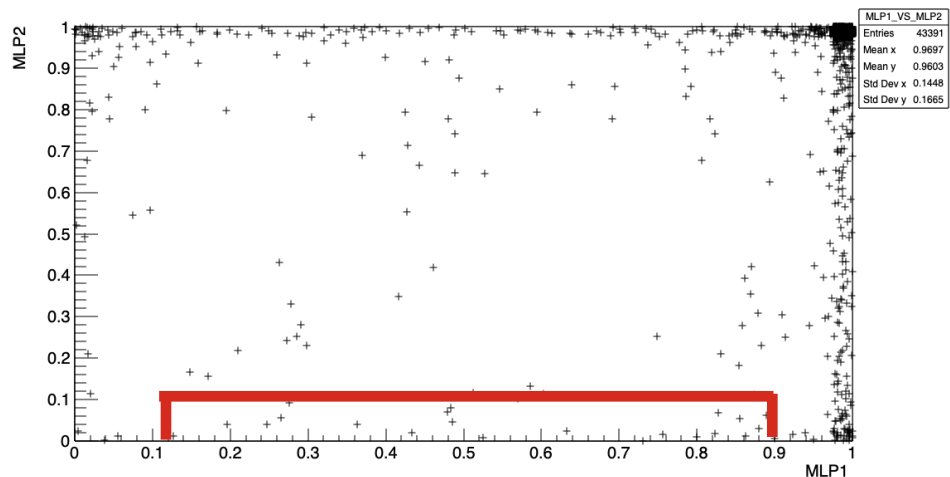


This leaves 0.16% of events left populating “no man’s land”

2. “No man’s land”



Actually let's pair 0.16% with the 0.04% that we called contamination into a 0.2% group



Is it reasonable?

3.3% total charge exchange reaction (π^+ and π^-)
0.2% contamination/unknown

Benchmark Study 1

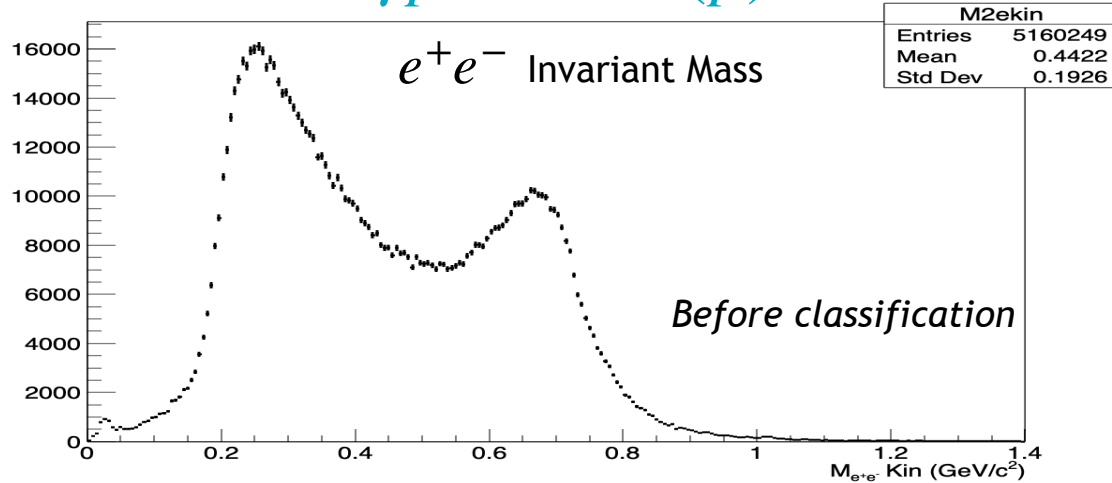
Use alternative pure sources of e^+e^- (from π^0 Dalitz decay) and $\pi^+\pi^-$ (from $\omega(782)$ decay) to test Neural Net classifier output distributions from training.

LEFT: 2018 GlueX data containing BH pairs and Rho0. Use NN to classify and separate.

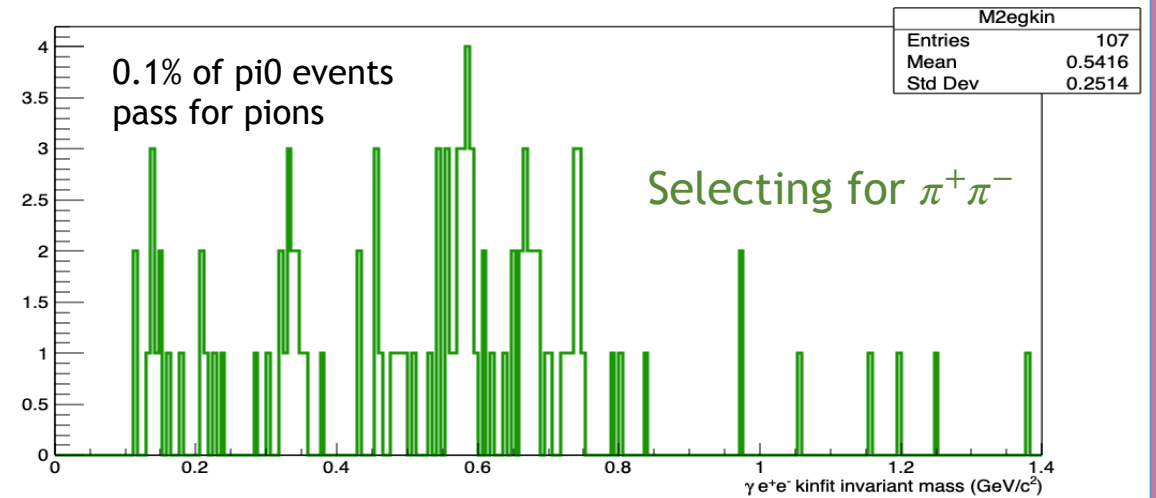
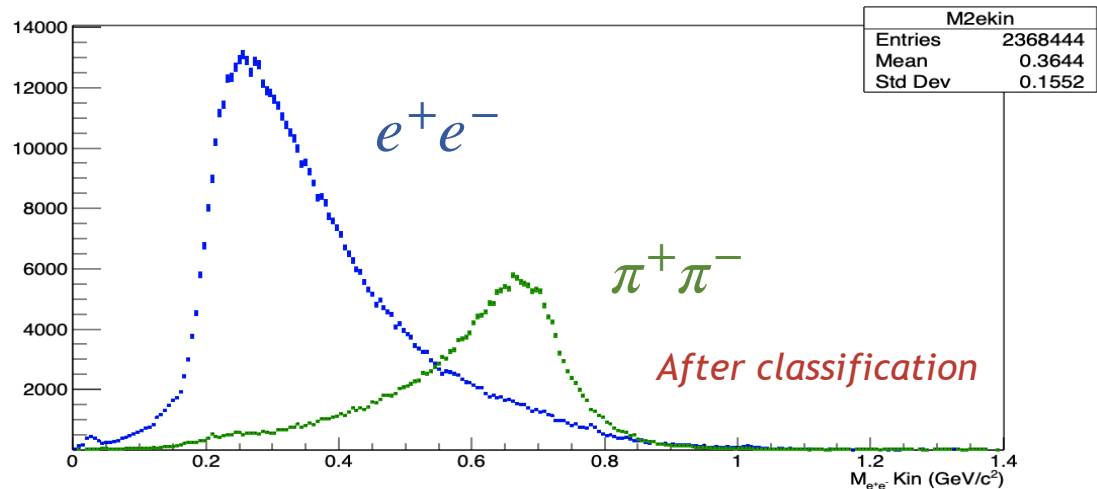
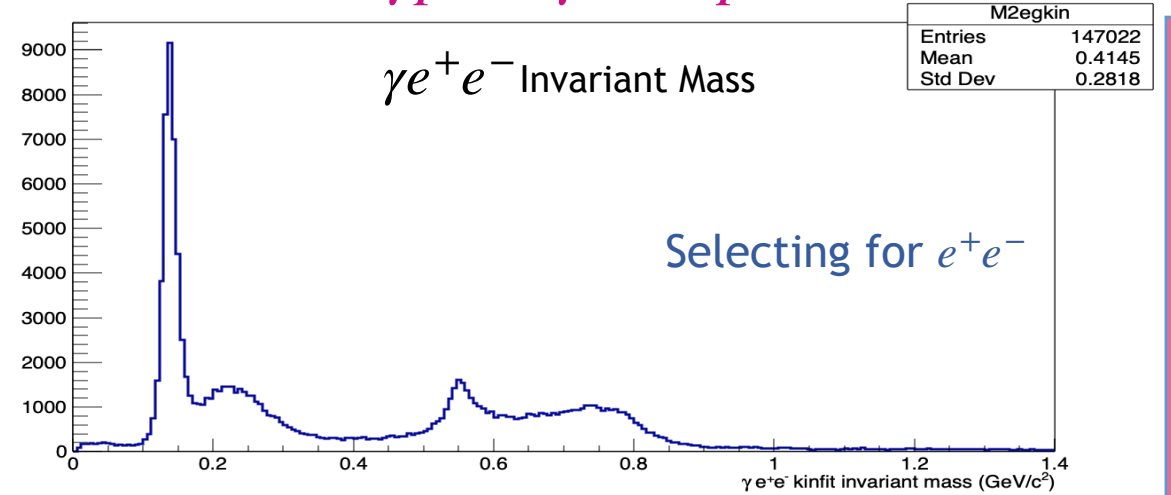
BENCHMARK STUDIES

RIGHT: 2018 GlueX data containing pi0 Dalitz decay. Select for pions and see how many e+e- pairs from pi0 get through.

$$\gamma p \rightarrow e^+ e^- (p)$$

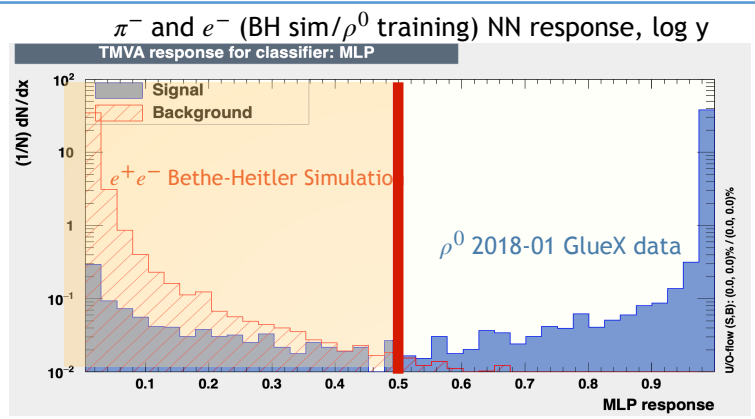
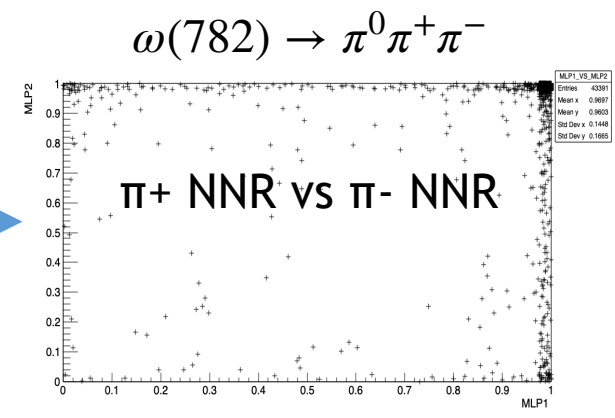
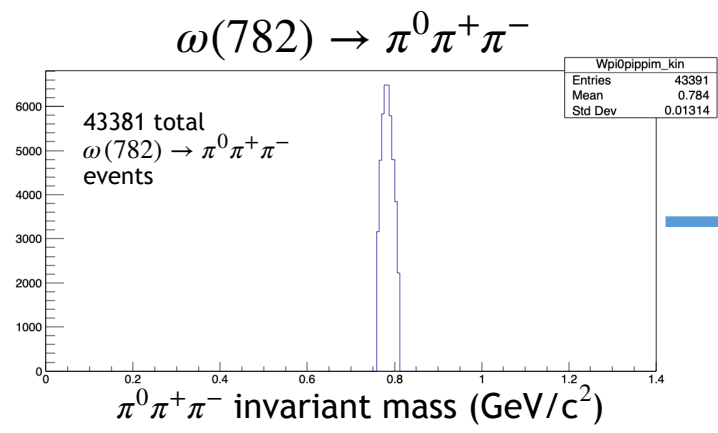
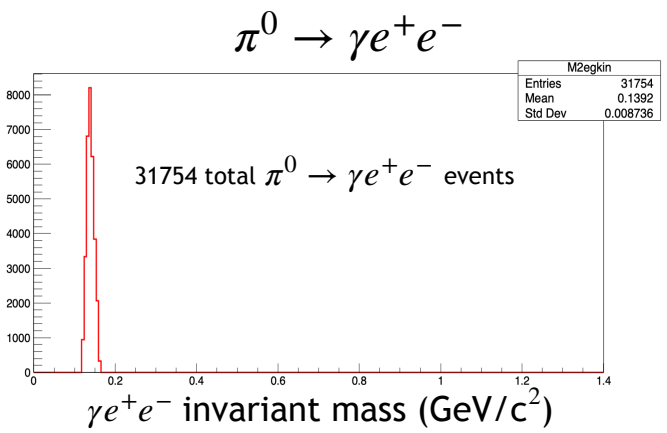


$$\gamma p \rightarrow \gamma e^+ e^- p$$



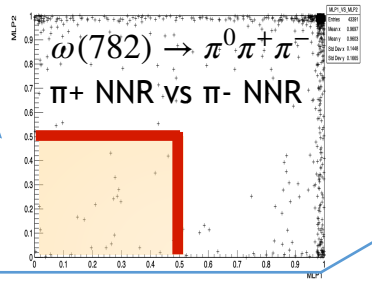
Same neural net and cut on NN response used in both studies

1: Get neural net response for e+e- from π^0 and $\pi^+\pi^-$ events from omega

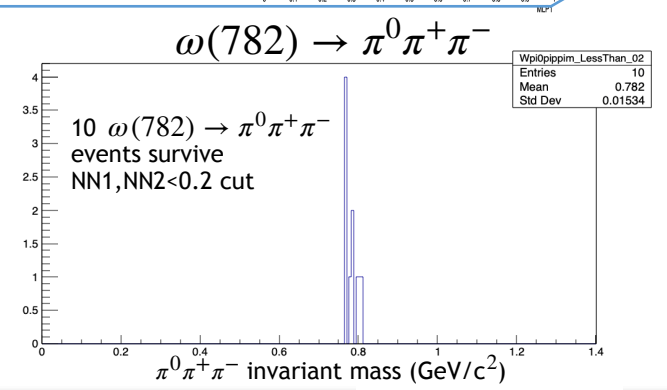
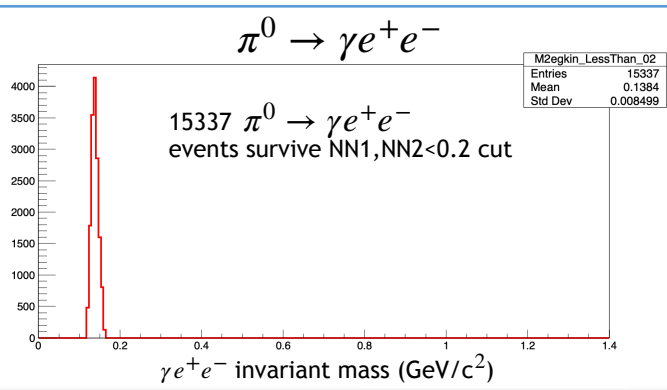


2. Pick a neural net response to be the integral boundary. Integrate all events to the left of that “cut point”

**since we're applying the same NNR cut to both tracks, it's really integrating within the square below:



3. Record how many events of each type get integrated for the cut point. Repeat steps 2 and 3 with a new cut point.

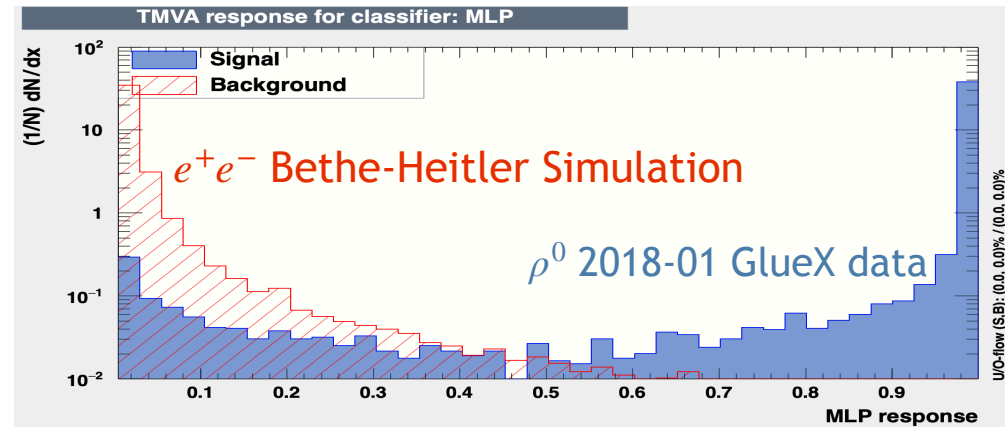


NN<	omega->Pion Efficiency	pi0->Electron Efficiency	Pions survived	e+e- survived
0.01	0.01613237768	20.81627511	7	6610
0.02	0.02304625383	48.29942684	10	15337
0.03	0.02996012998	64.04232538	13	20336
0.04	0.03226475536	72.84121685	14	23130
0.05	0.03456938075	78.32713989	15	24872
0.06	0.03917863151	82.0904453	17	26067
0.07	0.03917863151	84.9278831	17	26968
0.08	0.03917863151	87.09768848	17	27657

Two Integration Sweeps:

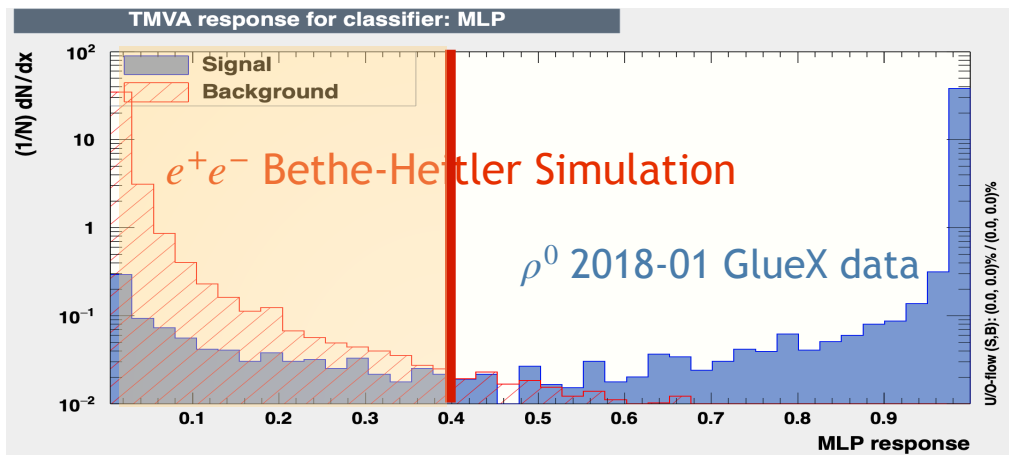
π^- and e^- (BH sim/ ρ^0 training) NN response, log y

**On this slide I'm showing the NN response for a single track from the training of the NN. This is only for building intuition on what regions will accept/reject pions and electrons. The actual NN response plots of the events I'm integrating are on subsequent slides.



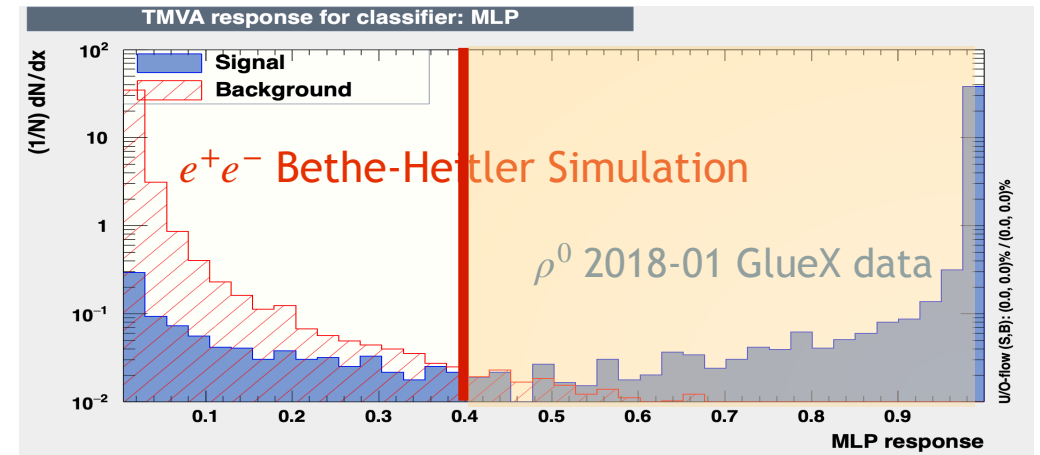
1. 'Less than' sweep: select e, reject π

π^- and e^- (BH sim/ ρ^0 training) NN response, log y

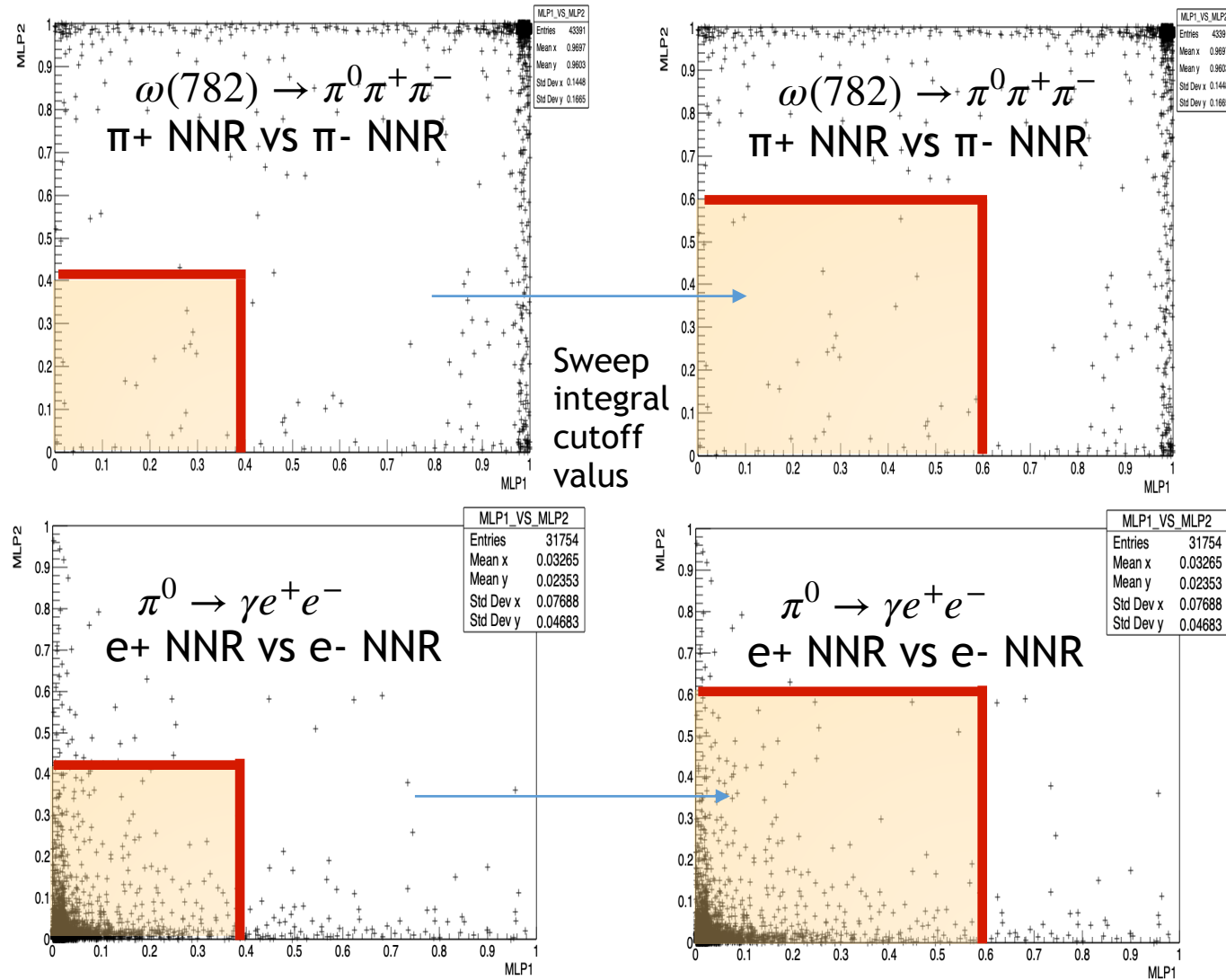


2. 'Greater than' sweep: select π , reject e

π^- and e^- (BH sim/ ρ^0 training) NN response, log y

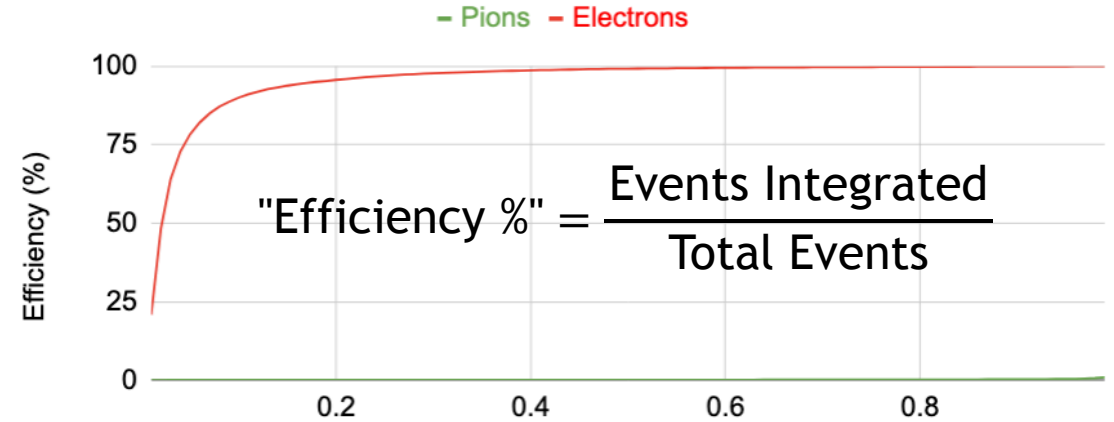


1. 'Less than' sweep: *select e, reject π*

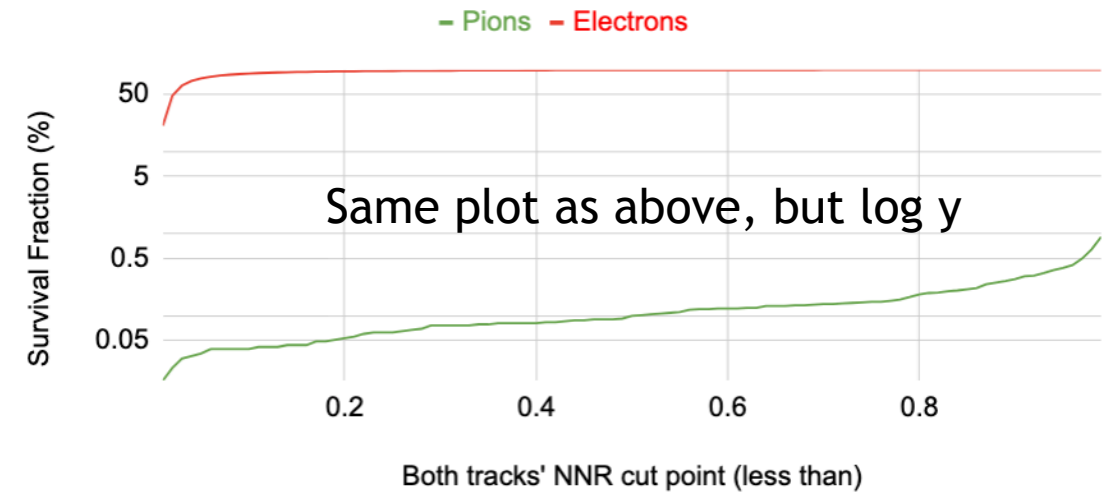


Results from integral sweep

Selecting for Electrons

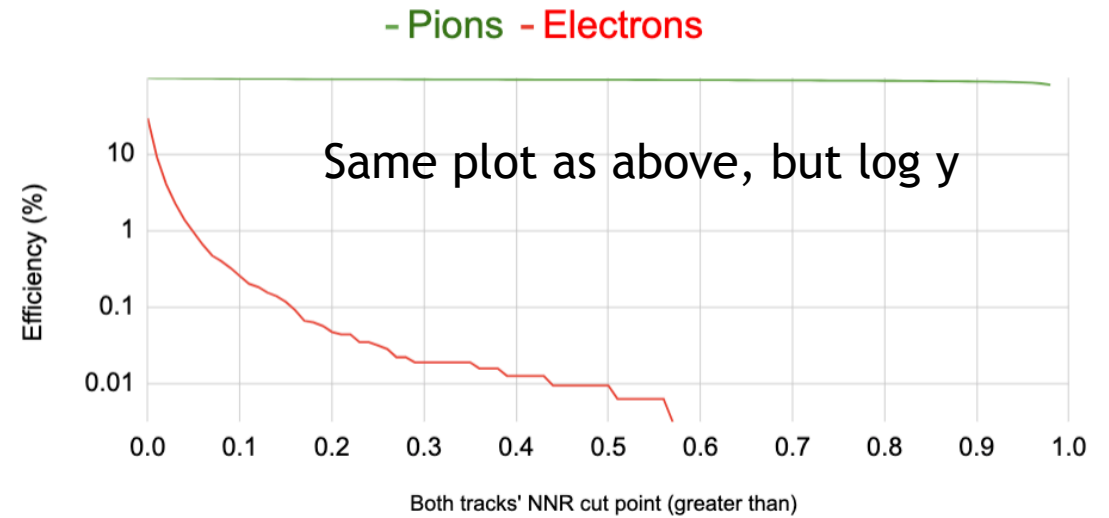
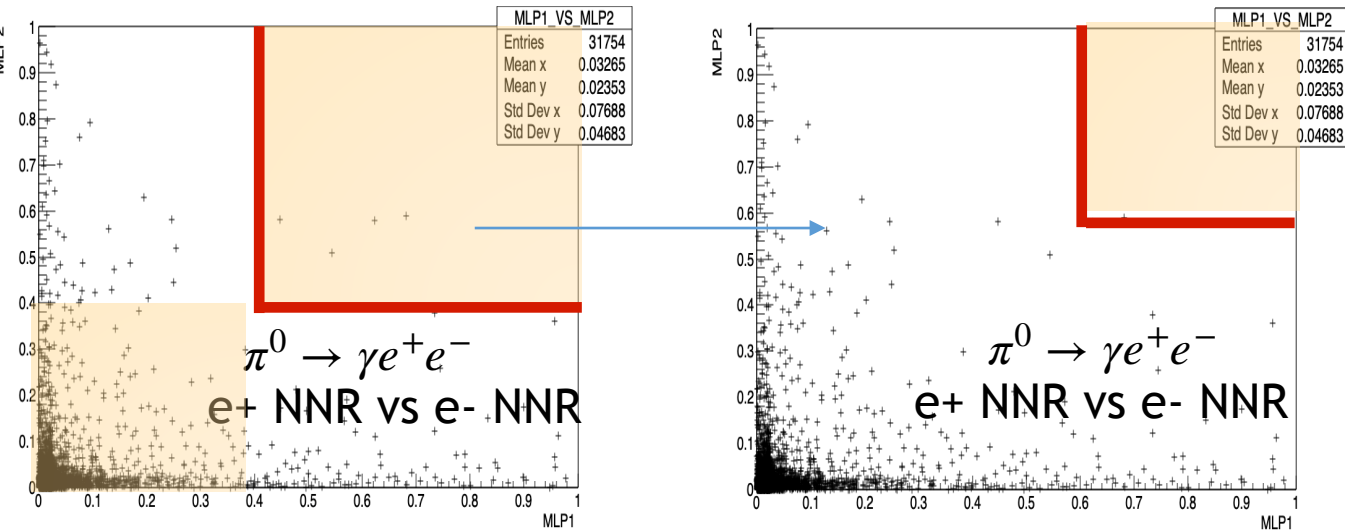
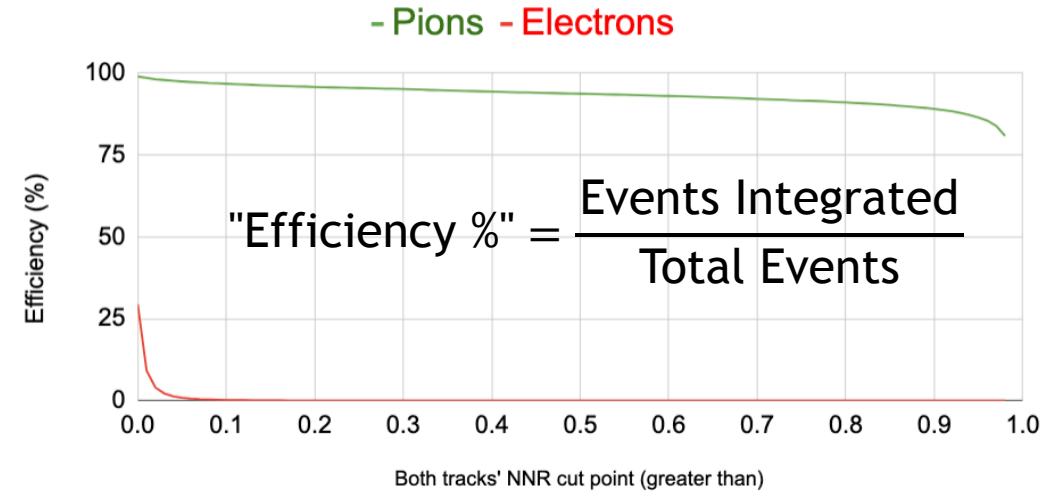
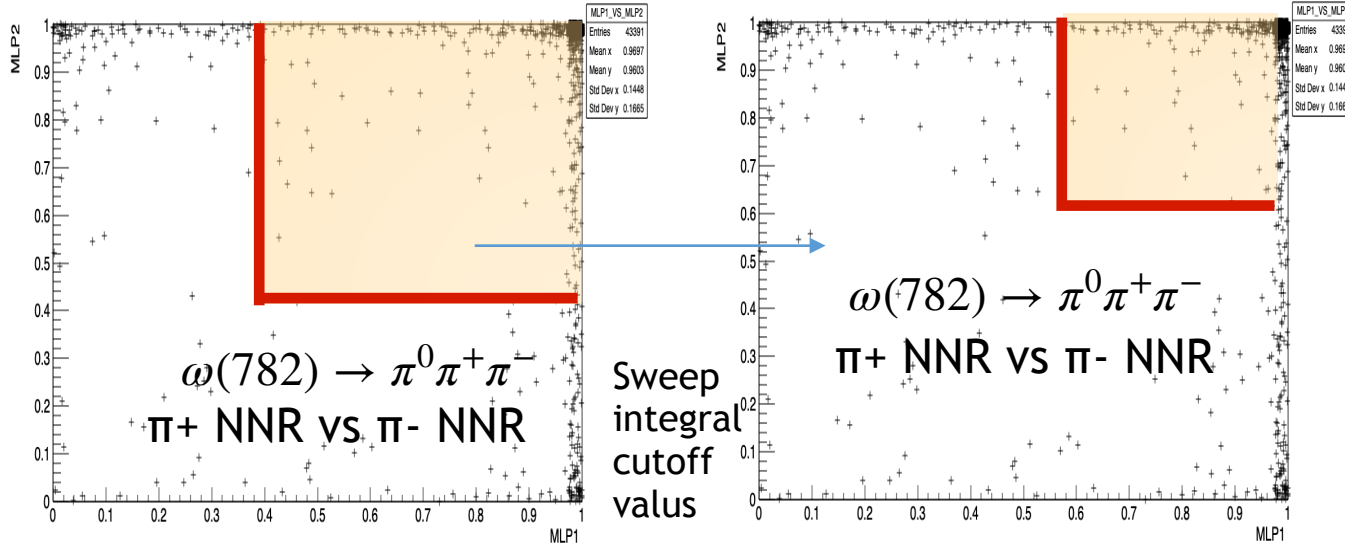


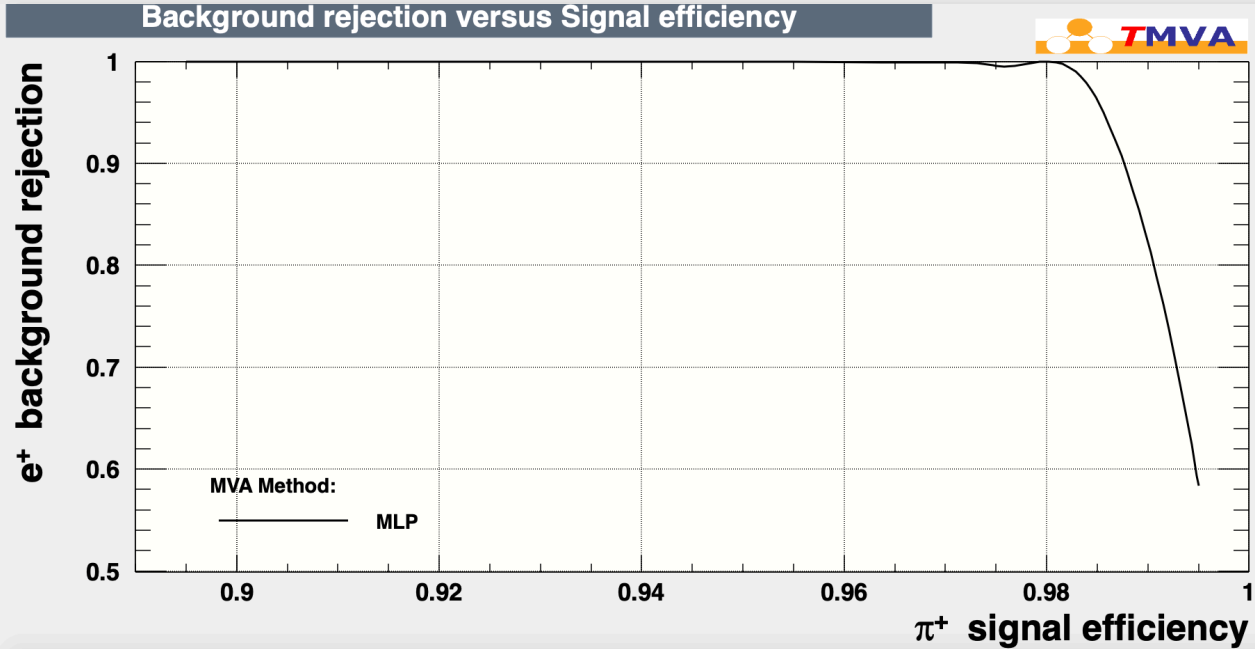
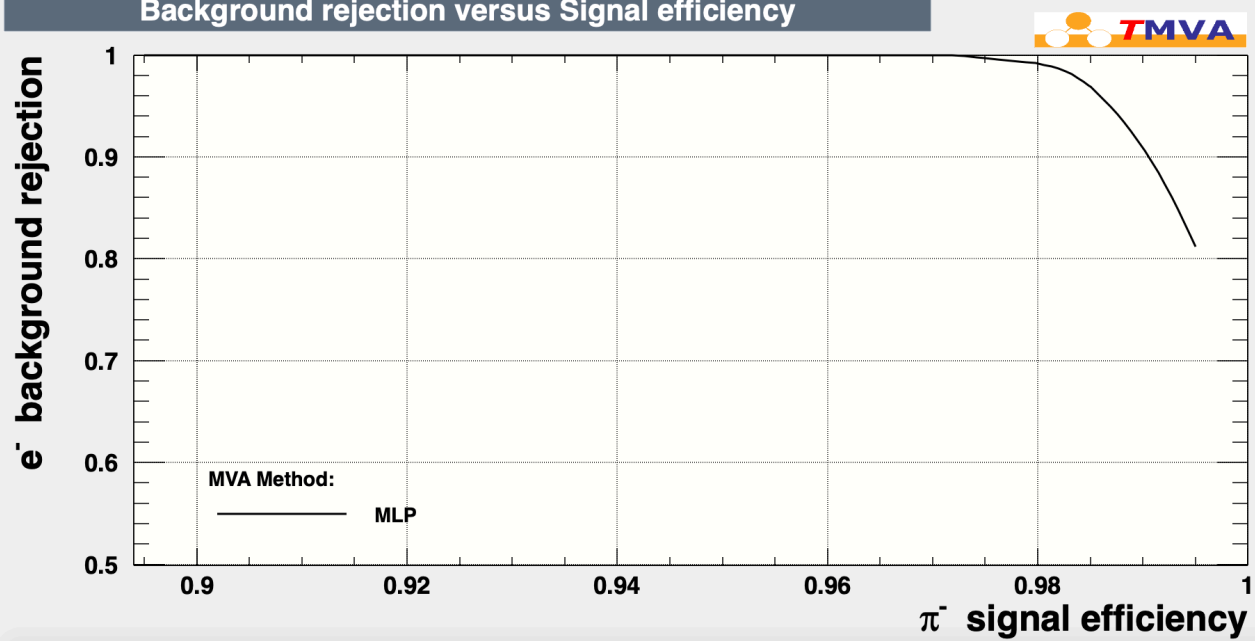
Selecting for Electrons



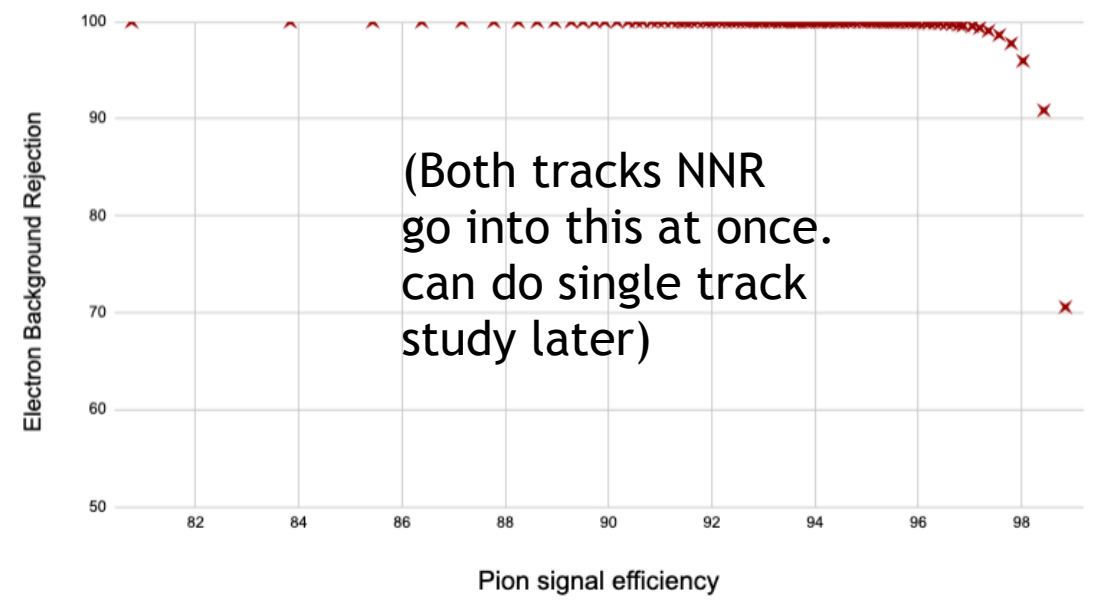
2. 'Greater than' sweep: *select π , reject e*

Results from integral sweep





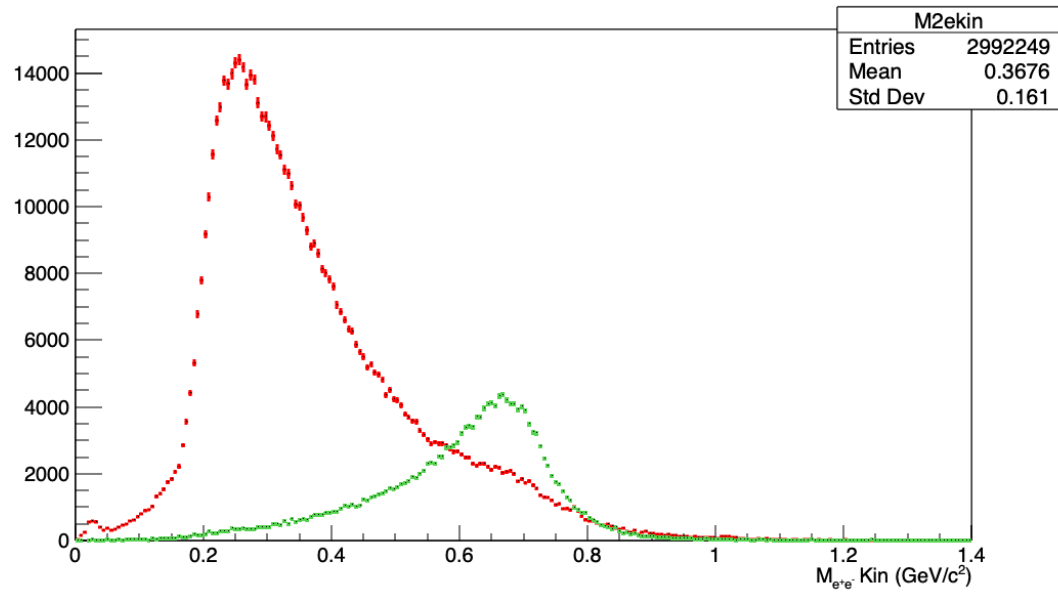
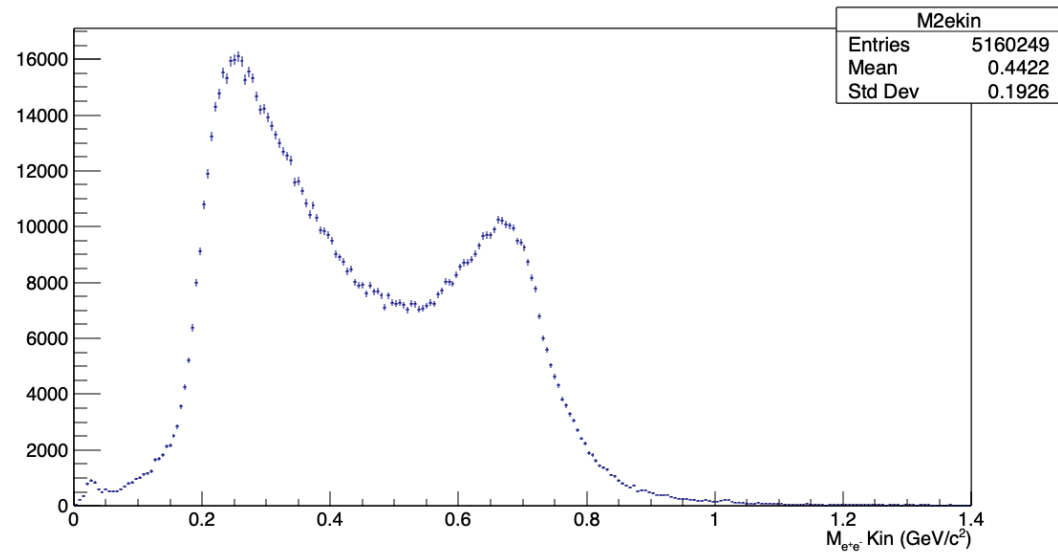
"ROC" style curve for accepting omega-> pion events, rejecting pi0->electron events

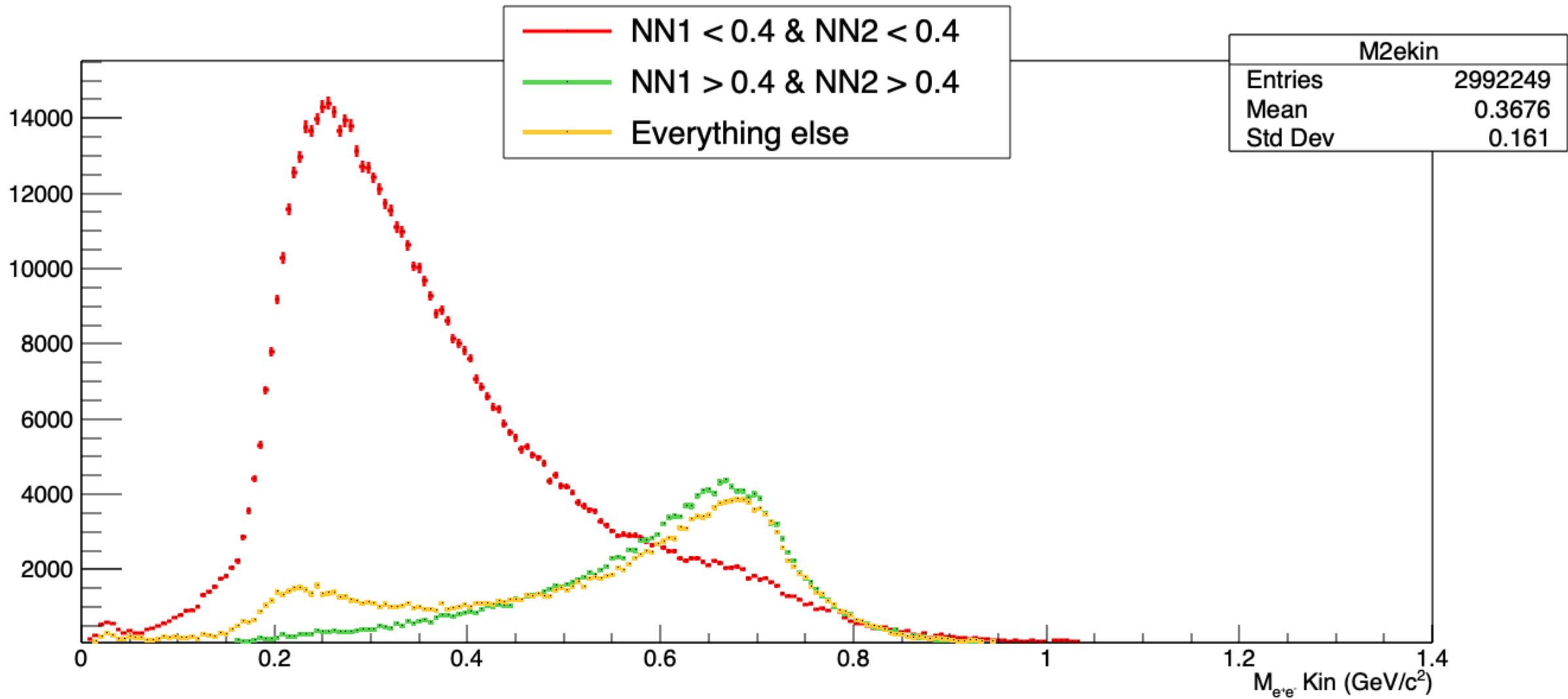


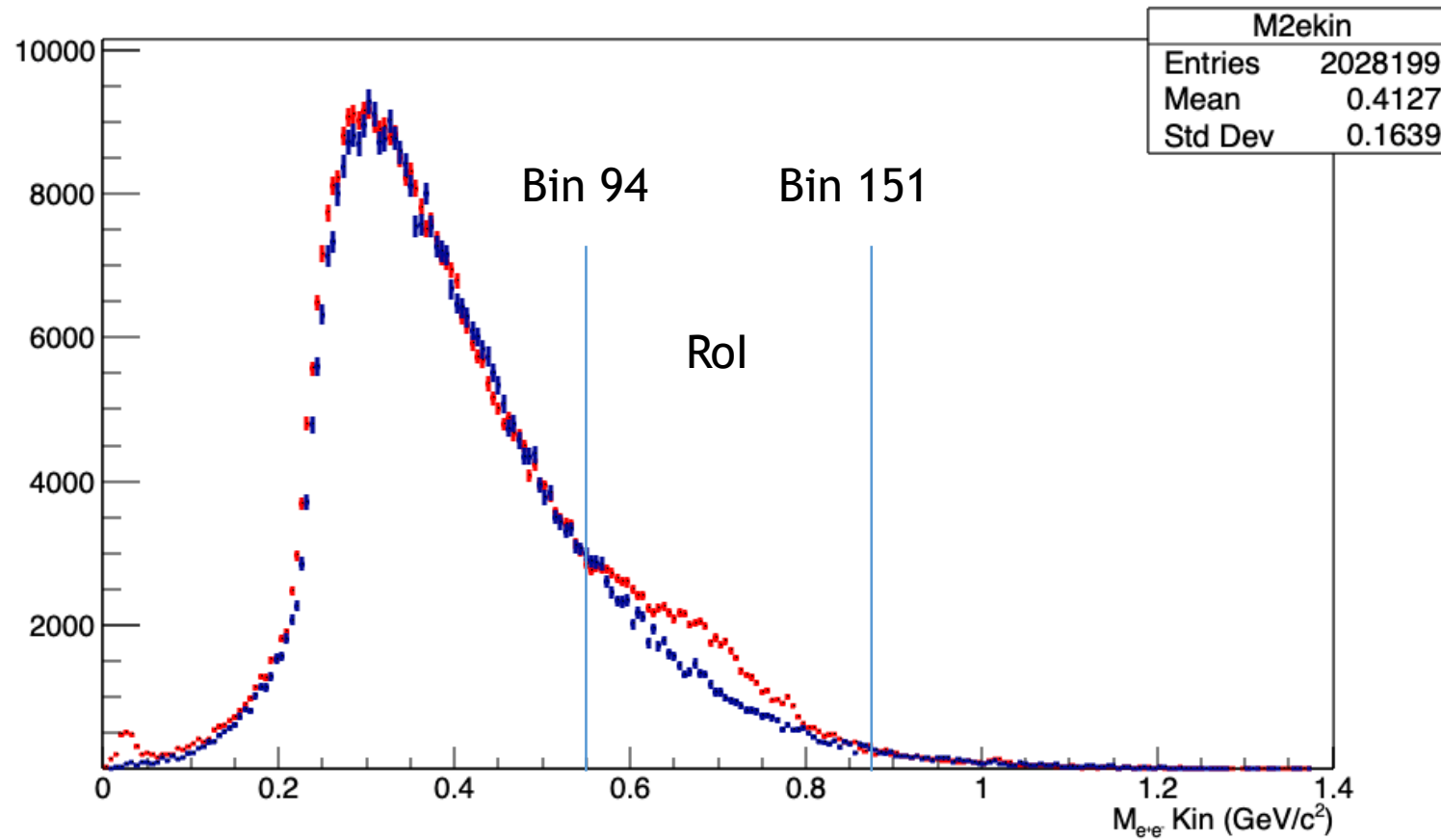
Differences: Training ROC curves can get 100% background rejection efficiency at 97% signal efficiency, whereas the double track data classification requires you to go down to 93%

Benchmark Study 2

Classify GlueX decay containing both ρ^0 pions and BH electrons.



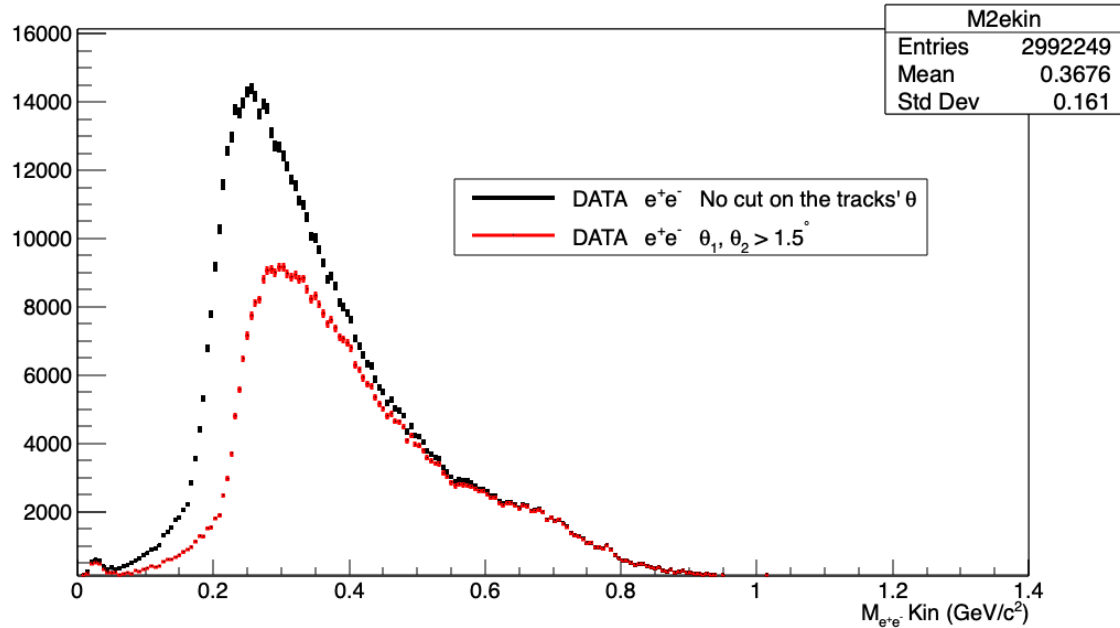




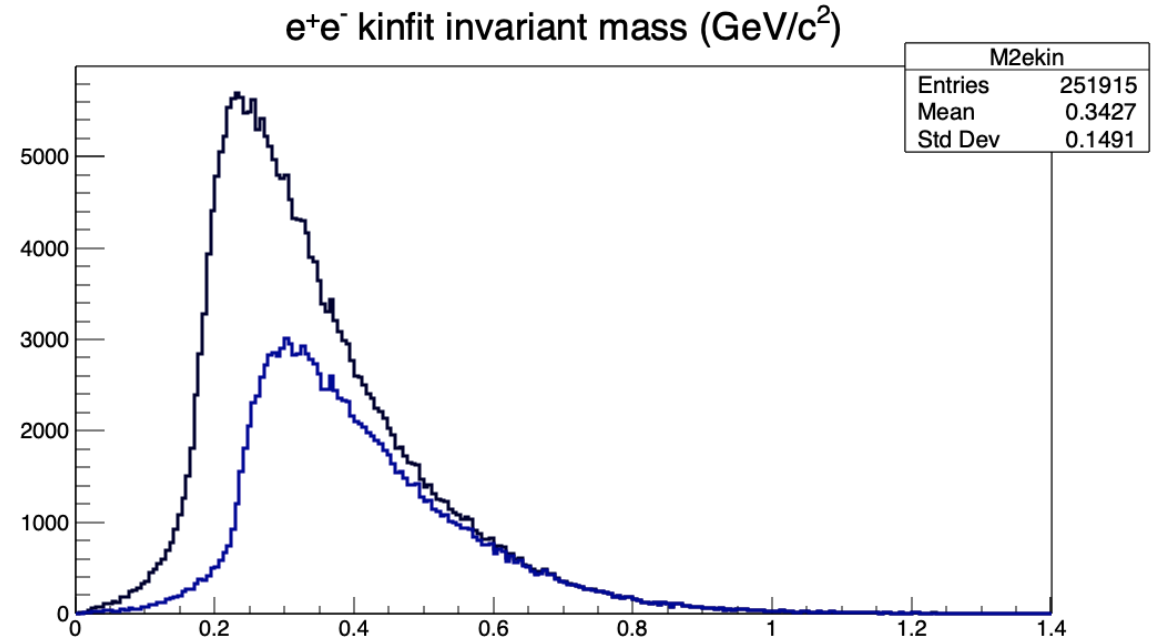
$$\frac{\int_{94}^{151} W_{data} dn}{\int_{94}^{151} W_{MC} dn} = \frac{86855.500}{68714.912} = 1.263997$$

Comparing theta cut ON with theta cut OFF in DATA and MC

DATA

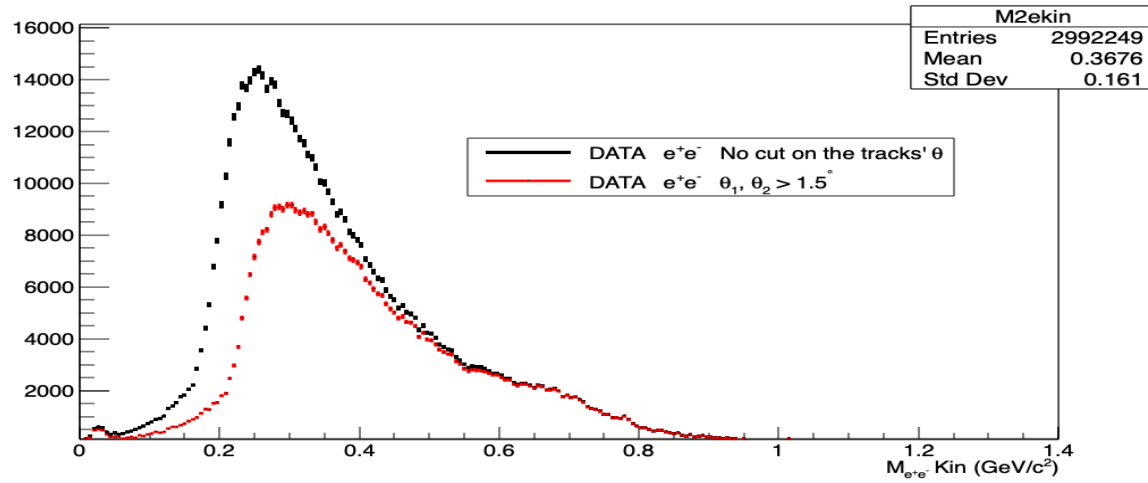


MC



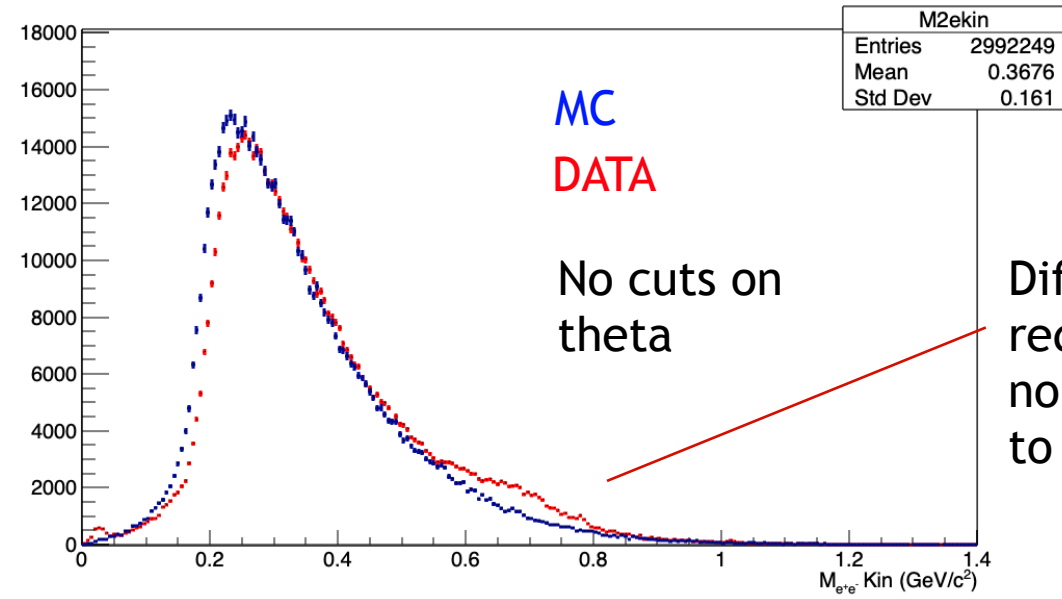
$$\frac{\int_{94}^{151} W_{\text{data}} dN}{\int_{94}^{151} W_{\text{data}, \theta > 1.5} dN} = 1.0215933$$

$$\frac{\int_{94}^{151} W_{\text{MC}} dN}{\int_{94}^{151} W_{\text{MC}, \theta > 1.5} dN} = 1.0523269$$



$$\frac{\int_{94}^{151} W_{\text{data}} dN}{\int_{94}^{151} W_{\text{data}, \theta > 1.5} dN} = 1.0215933$$

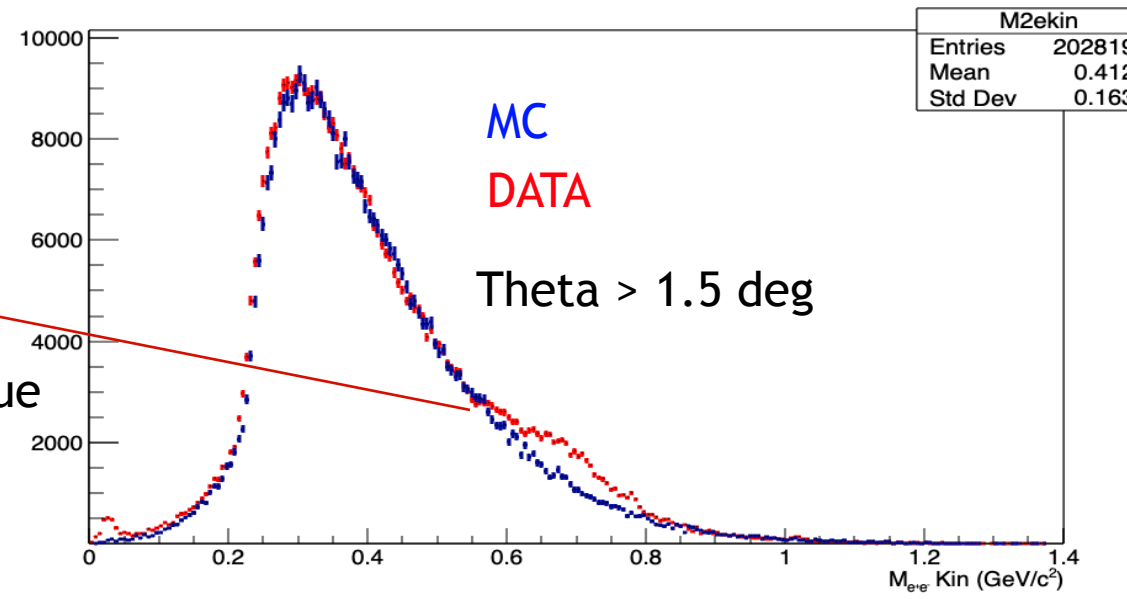
2% difference in Rol



MC
DATA

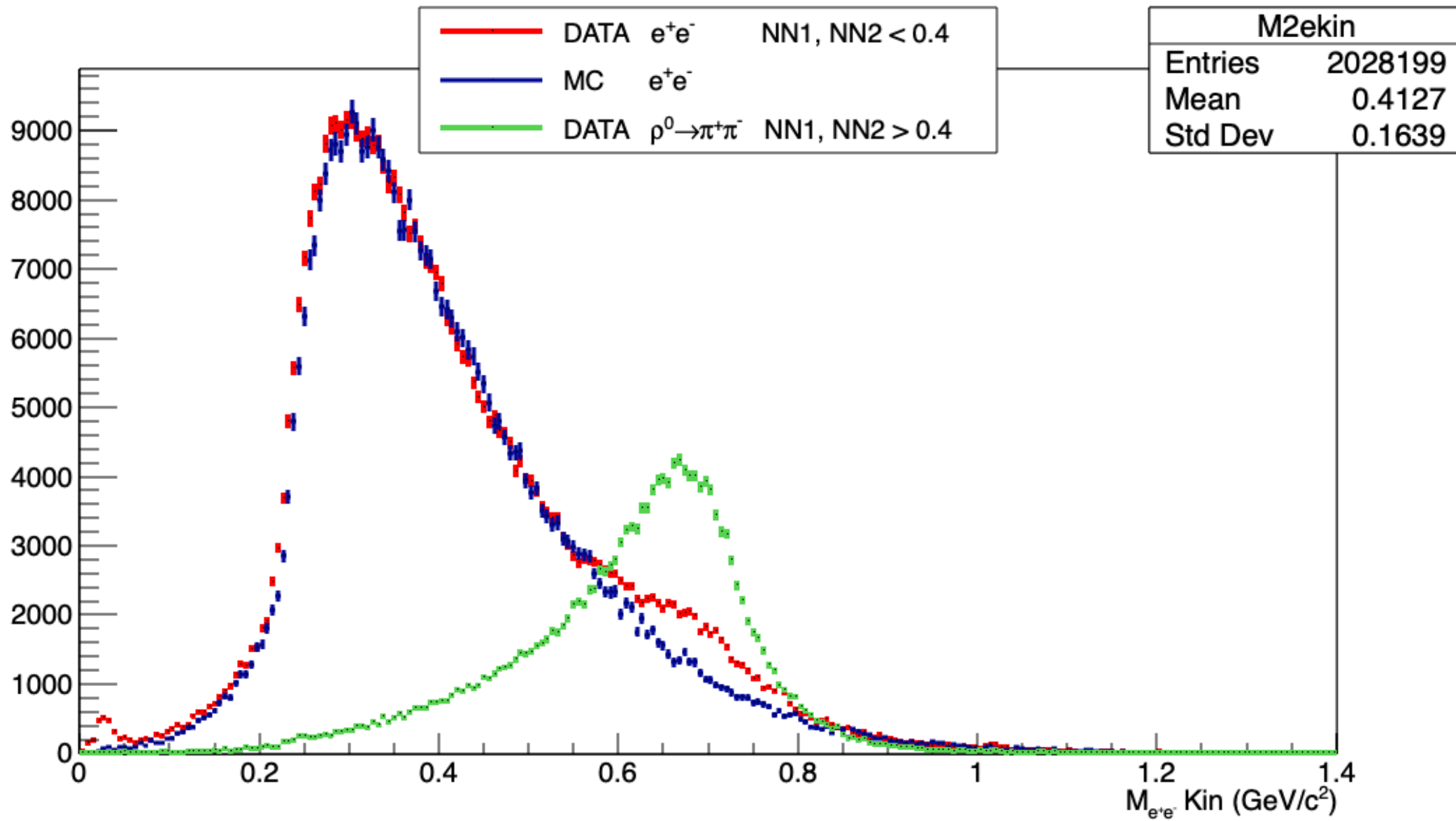
No cuts on theta

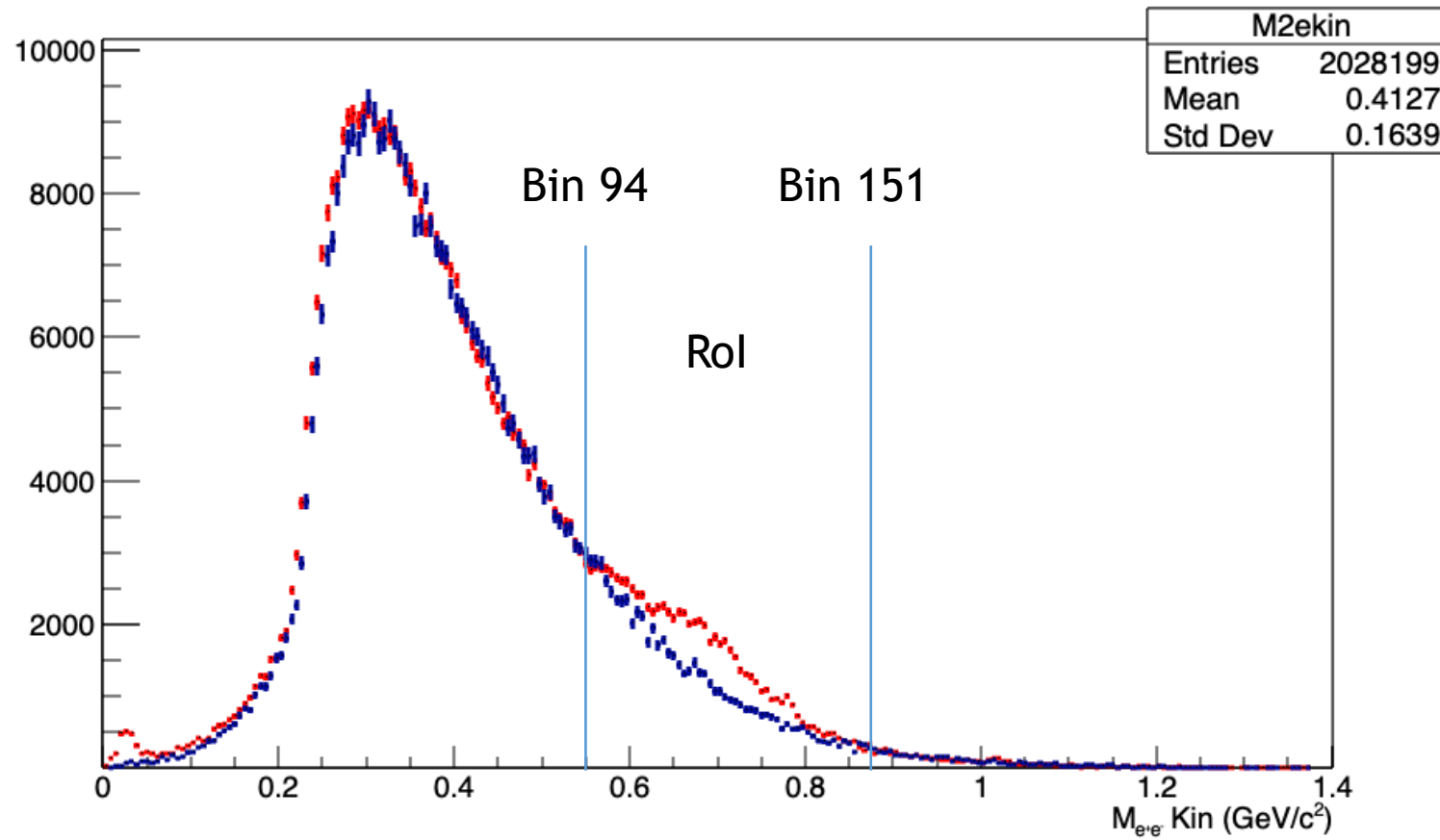
Difference in red curve between no cut/theta cut due to vertical scale



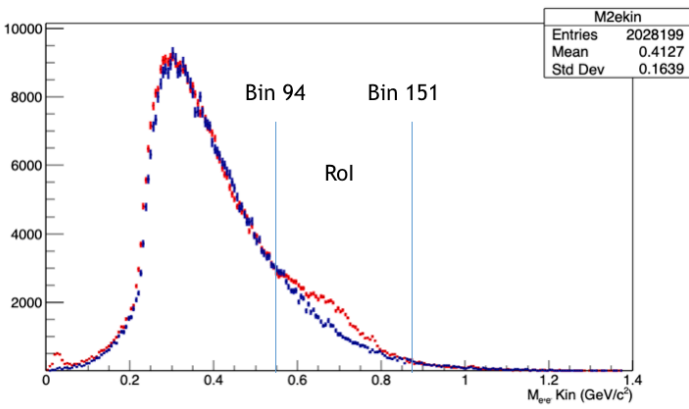
MC
DATA

Theta > 1.5 deg

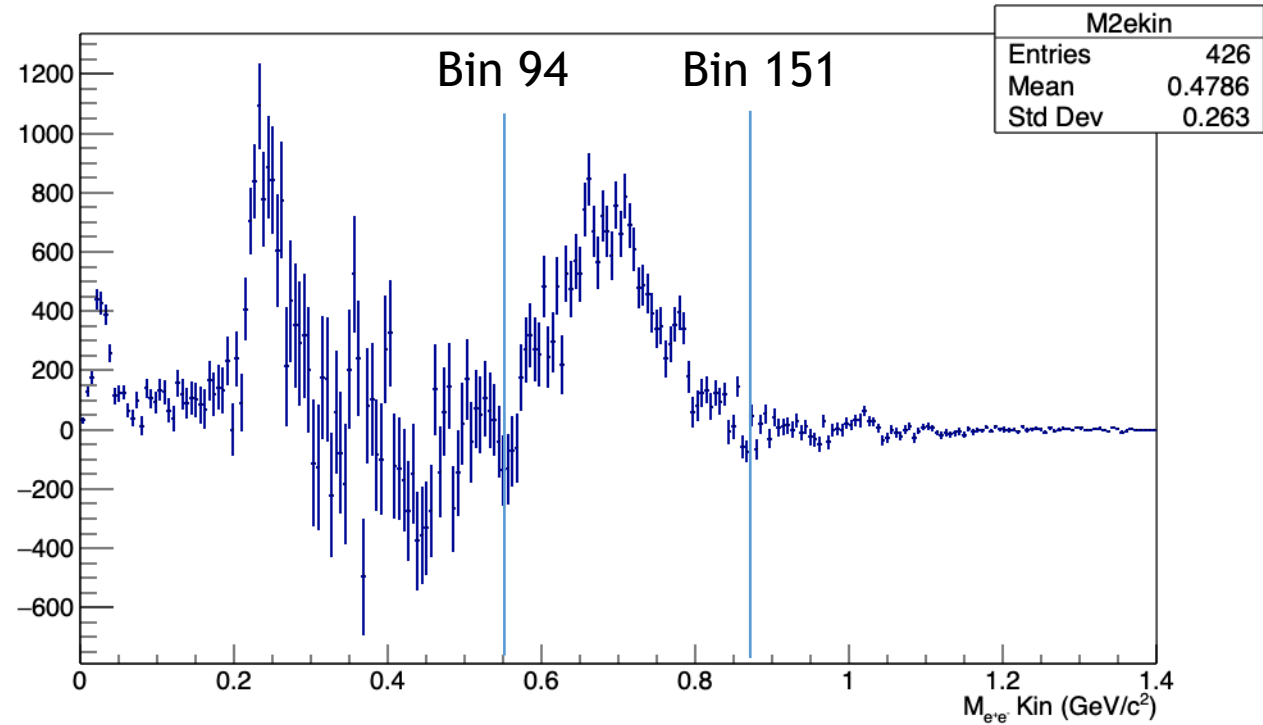




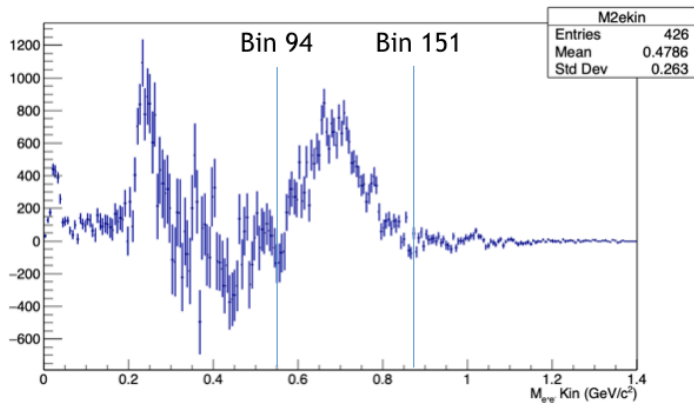
$$\frac{\int_{94}^{151} W_{data} dn}{\int_{94}^{151} W_{MC} dn} = \frac{86855.500}{68714.912} = 1.263997$$



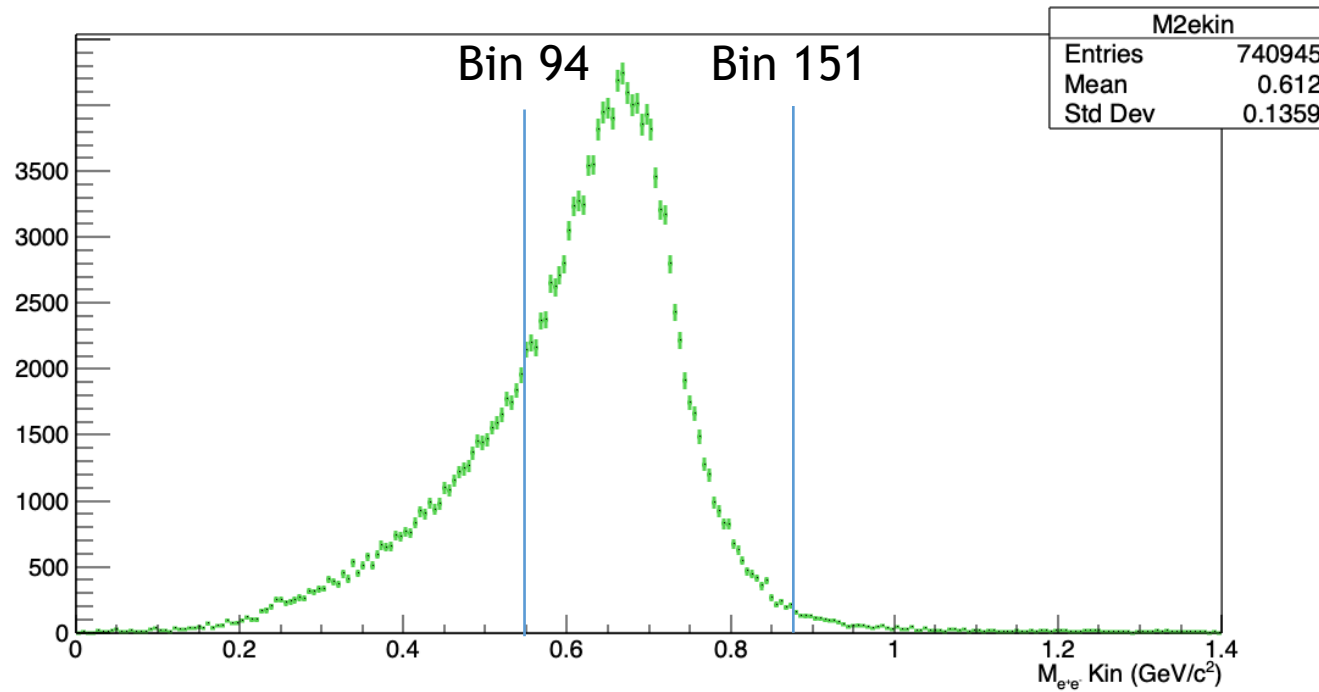
Subtract the MC distribution from the data and plot the difference



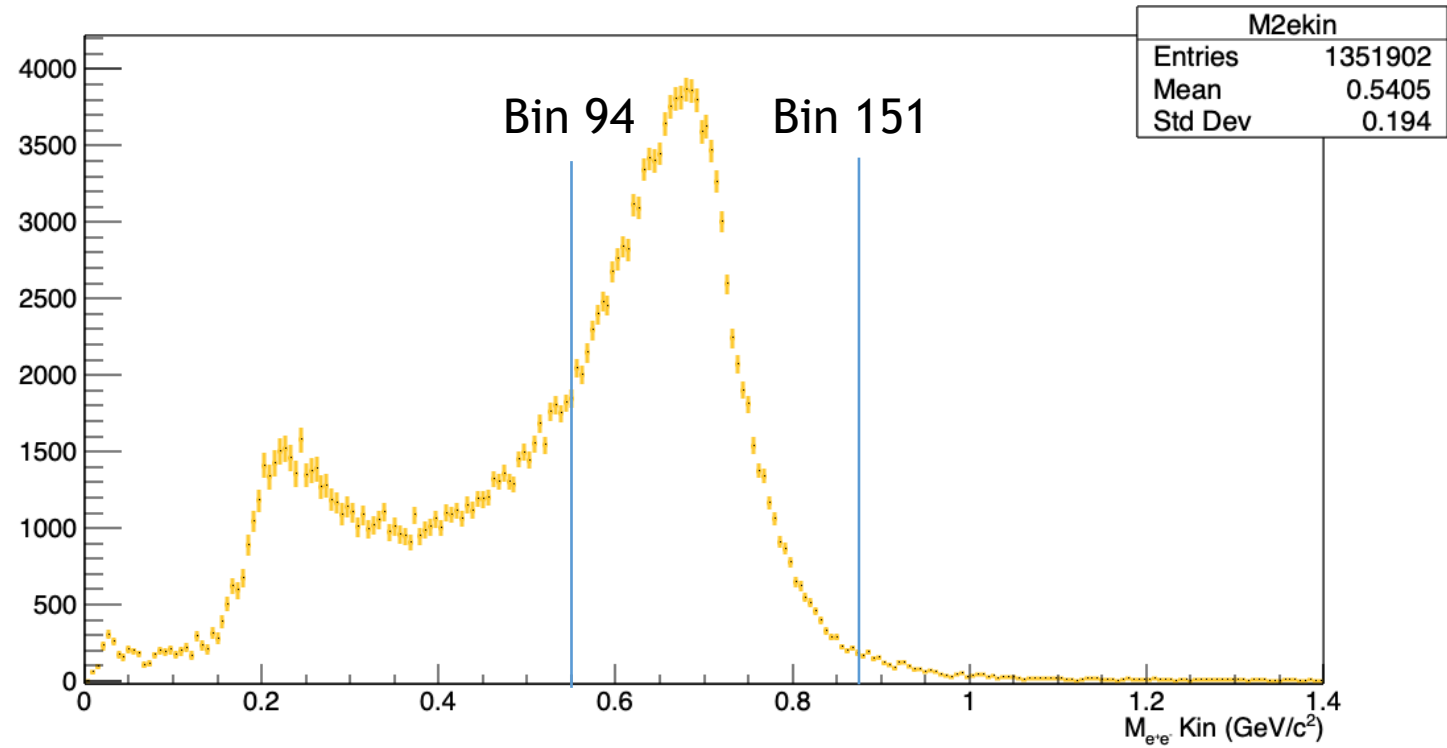
$$\int_{94}^{151} (W_{data} - W_{MC})dn = 18140.588$$



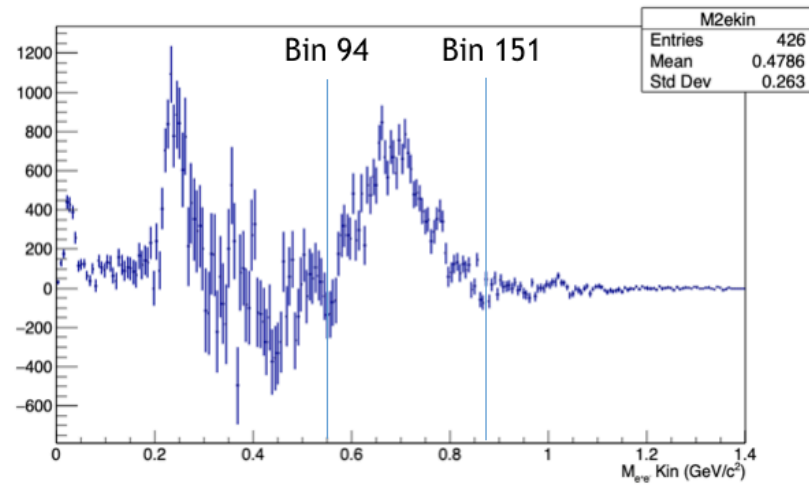
$$\int_{94}^{151} (W_{data} - W_{MC}) dn = 18140.588$$



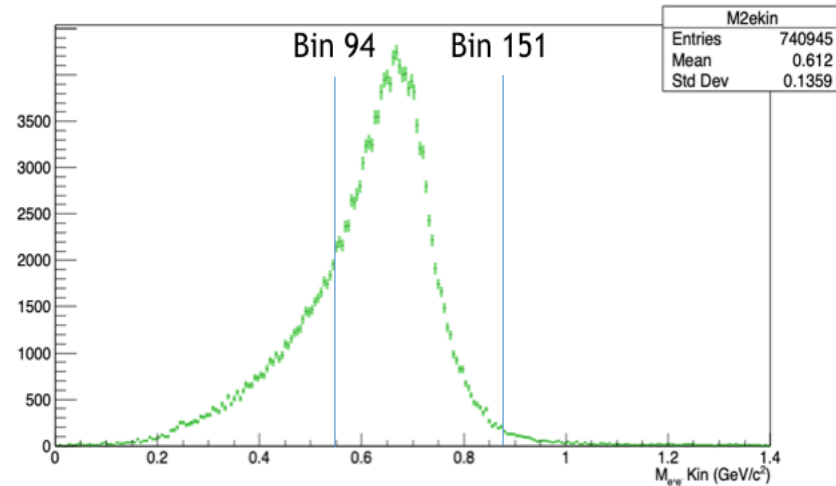
$$\int_{94}^{151} W_{\rho} dn = 125071.50$$



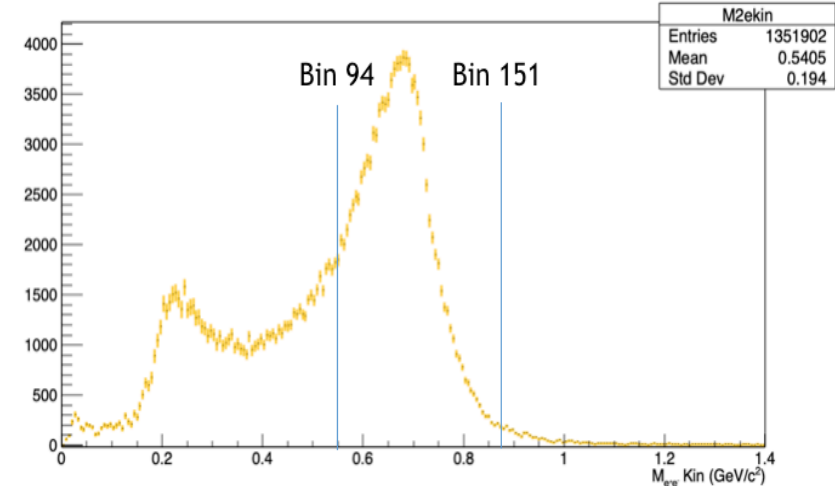
$$\int_{94}^{151} W_{\rho_{\text{rejected}}} dn = 116950.00$$



$$\int_{94}^{151} (W_{data} - W_{MC}) dn = 18140.588$$



$$\int_{94}^{151} W_{\rho} dn = 125071.50$$



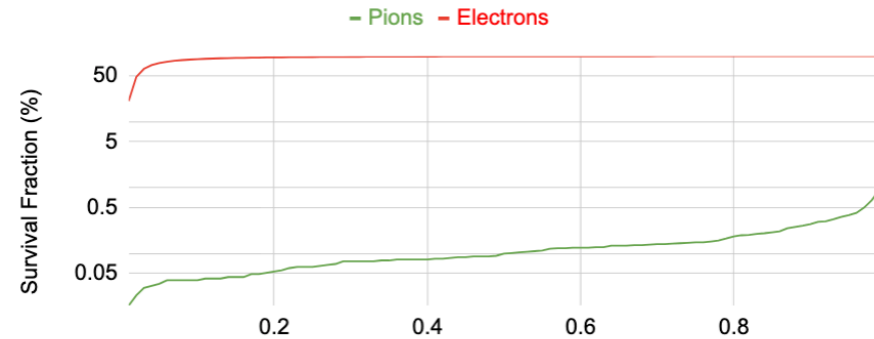
$$\int_{94}^{151} W_{\rho_{\text{rejected}}} dn = 116950.00$$

Assume difference is purely pion contamination from Rho0. Does the assumption hold up to previous studies?

$$\frac{\int W_{diff}}{\int (W_{diff} + W_{\rho} + W_{rej})} = \frac{18140.588}{18140.588 + 125071.50 + 116950.00} = 0.069728023$$

6.9% survival fraction under this assumption.
Let's compare to omega/pi0 study:

Selecting for Electrons



Both tracks' NNR cut point (less than)

0.046214761

Cut point

Pion %

Electron %

0.4

0.08066188841

98.68677962