



# **PandoraPFA: Software Compensation**

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# Software Compensation



Hadron showers in the detector consist of electromagnetic and purely hadronic sub-showers

Electromagnetic component originates from production of  $\pi^0$  and  $\eta$  particles in hadronic showers, which decay into two photons

- response for electromagnetic sub-showers typically higher than for hadronic sub-showers
- Electromagnetic component typically denser and narrower

Use local energy density to reweight hit-energy contributions based on the fact that electromagnetic sub-showers tend to be denser

- Local **software compensation** technique developed by CALICE

More information about software compensation as concept and the derivation of weights can be found in the paper **Eur. Phys. J. C 77, 698 (2017)**

<https://arxiv.org/abs/1705.10363>

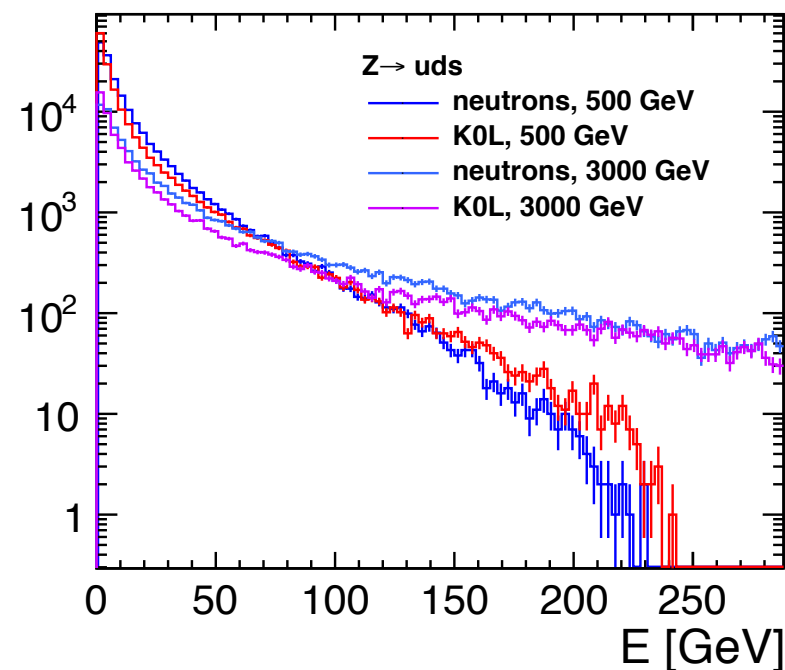
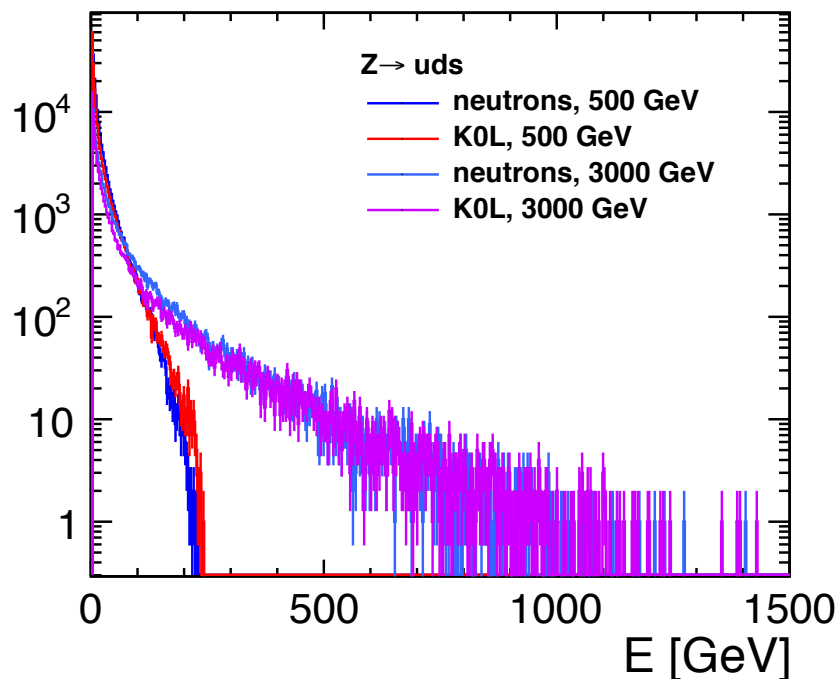


# **First training of SoftwareCompensation With model CLIC\_o3\_v13**

# Hadron Energy spectrum for CLIC (Zuds 500 vs Zuds 3000 GeV)



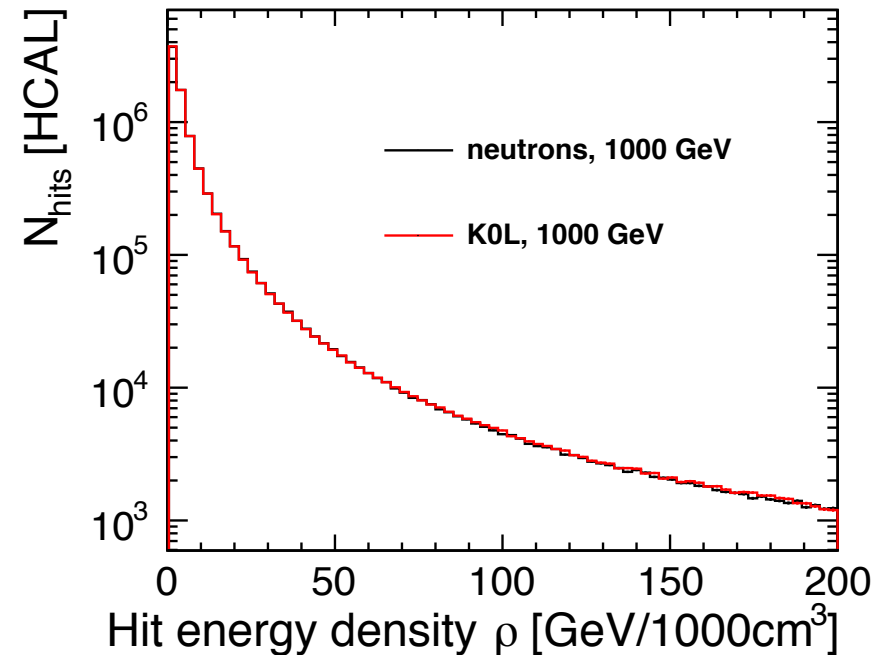
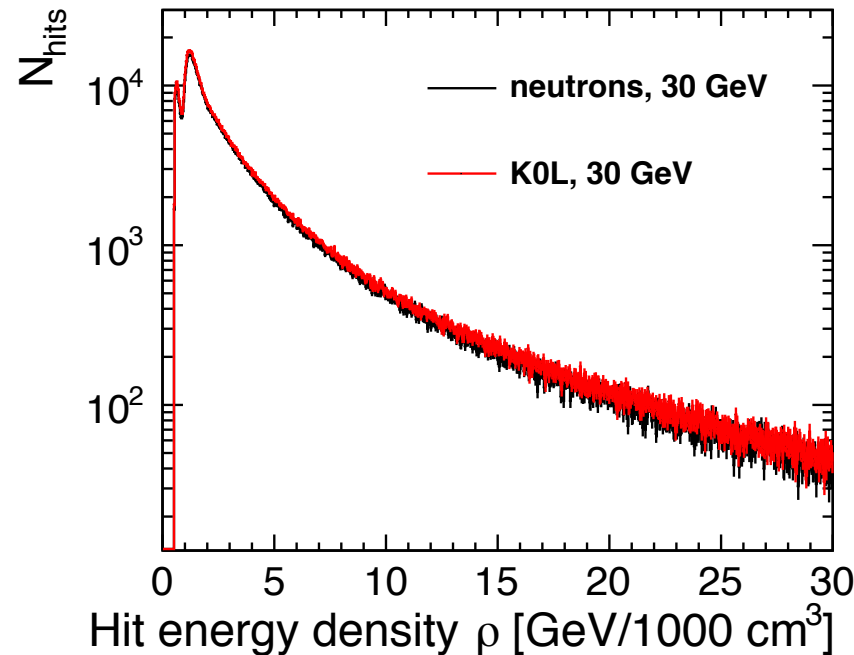
For 500 GeV dataset neutral hadron energies beyond 90 GeV are 1.9 %, for 3000 dataset 13.7 %  $\rightarrow$  if we want same coverage of neutral hadron energy spectrum need to calculate weights for samples up to far higher energies (1.7 % of hadrons with energies beyond 400 GeV for 3000 GeV sample)



# Check on hit energy densities for very high K0L



Re-weighting applied in energy density bins  $\rightarrow$  extend weight bins to densities of  $100 \text{ GeV}/\text{dm}^3$ , set overflow bin to  $110 \text{ GeV}/\text{dm}^3$  (default overflow bin at  $30 \text{ GeV}/\text{dm}^3$ )



The energy of calorimeter clusters are computed as:

$$E_{\text{SC}} = \sum_{\text{hits}} E_{\text{ECAL}} + \sum_{\text{bin } i} (E_{\text{HCAL}}^i \times \omega(\rho_i))$$

$$\text{with } E_{\text{HCAL}}^i = \sum_{\text{hits} \in \text{bin } i} E_{\text{hit}},$$

$$\omega(\rho) = p_1 \exp(p_2 \rho) + p_3$$

# Samples and Software used



Produce single particle gun samples of neutrons and K0L's separately, for each point simulate and reconstruct 80000 events

Use the **PandoraSettingsSoftwareCompensationTraining** script for reconstruction

Cleaning of clusters in the Pandora training script identical to cleaning for default reconstruction

→ Then run **PandoraPFACalibrate\_SoftwareCompensation** script in PandoraAnalysis/calibration

Energy points at 2,5,10,20,30,40,50,60,75,90,100,150,200,250,400,500,1000 GeV for neutrons and Kaons, for Kaons additional energy point at 1 GeV

Merge Kaons and neutrons in one sample and use energy points of 2,5,10,30,50,75,150,200,400 for software compensation training

→ using all samples lead to too high memory consumption

Density binning: 0 2 5 7.5 9.5 13 16 20 23.5 28 33 40 50 75 100, overflow 110

# Default vs CLIC Software compensation



Default: apply software compensation for hadron energies up to 100 GeV, extend the range to all hadrons (i.e. as value give 1800 GeV)

Weight applied as function of hit energy density:

Default binning: 0 2 5 7.5 9.5 13 16 20 23.5 28, last bin set to 30 (overflow bin set to 30 GeV/dm<sup>3</sup> for reweighting)

NEW CLIC binning (lower binning identical):

28 33 40 50 75 100, last bin set to 110

→ weights are separately very different, default weight energy dependence leads to an almost constant reweighting at high energies for various hit energy densities

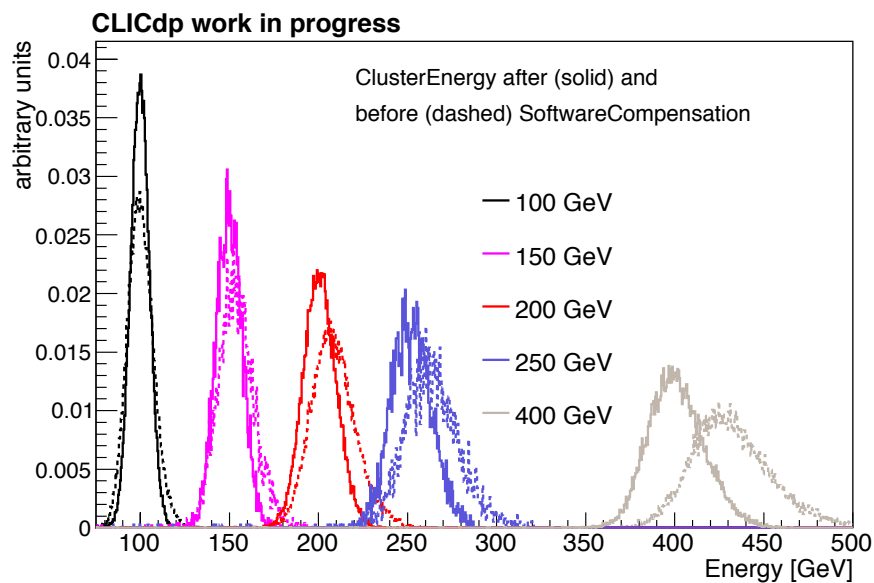
Previously for a 200 GeV neutron reweighting is 0.752 for 3 GeV/dm<sup>3</sup> hit as well as for 30 GeV/dm<sup>3</sup>

Now for 200 GeV neutron weight for 3 GeV/dm<sup>3</sup> is 0.881 and for 30 GeV/dm<sup>3</sup> it is 0.878 (n+K0L)

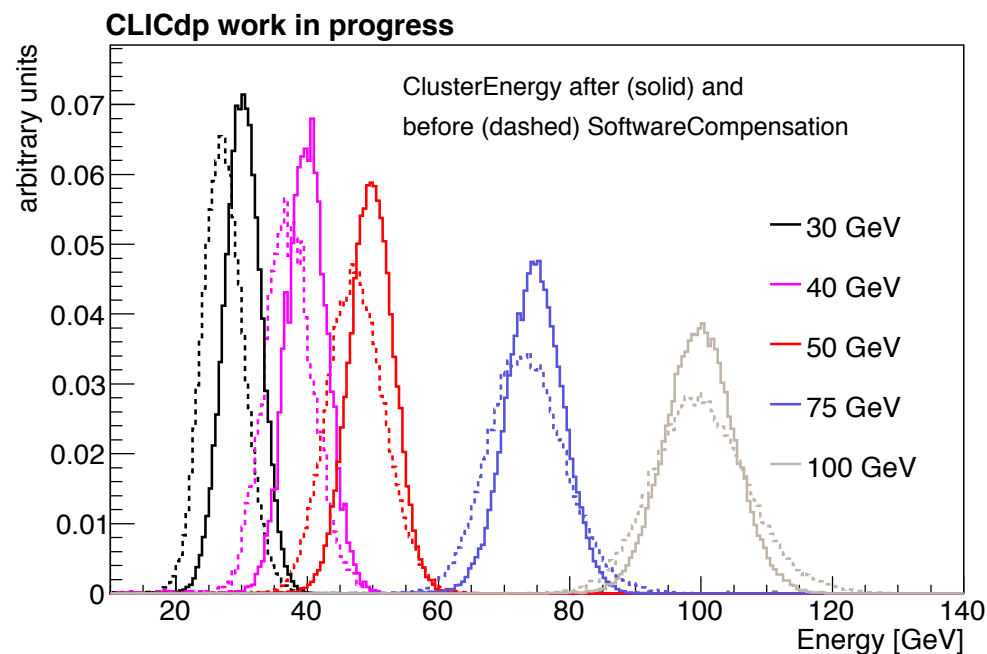


## Self-closure of training: neutrons

Compare cluster distribution without software compensation and after applying the software compensation weights on the hits for self-closure of the training



Nice closure of procedure, takes care of non-linearities in response as well



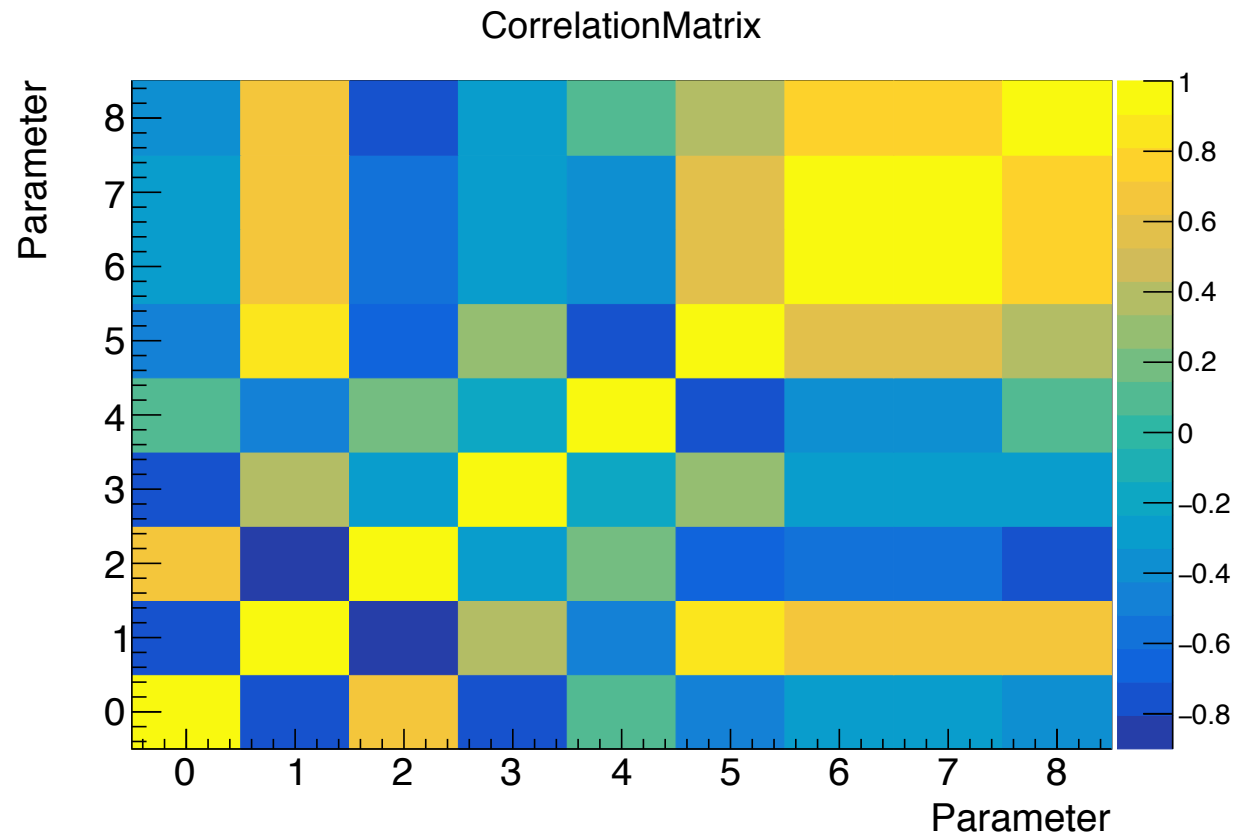


# Errors of Parameters



Estimate error and covariance matrix using the Hessian Matrix: Large (anti)correlations between different parameters → is this behavior expected or has this been studied previously

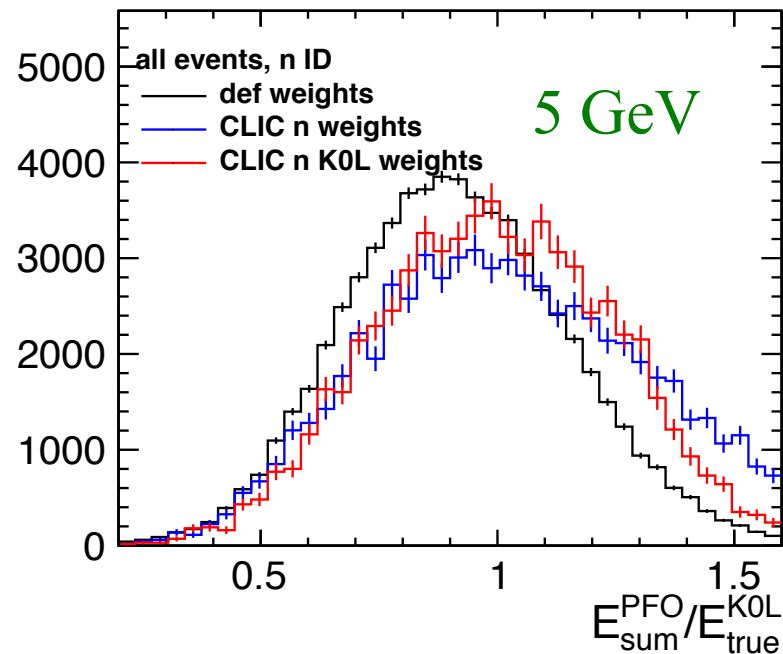
Upper/lower error determination by Minos fails to converge



# Single Hadron response closures: low energy Kaons

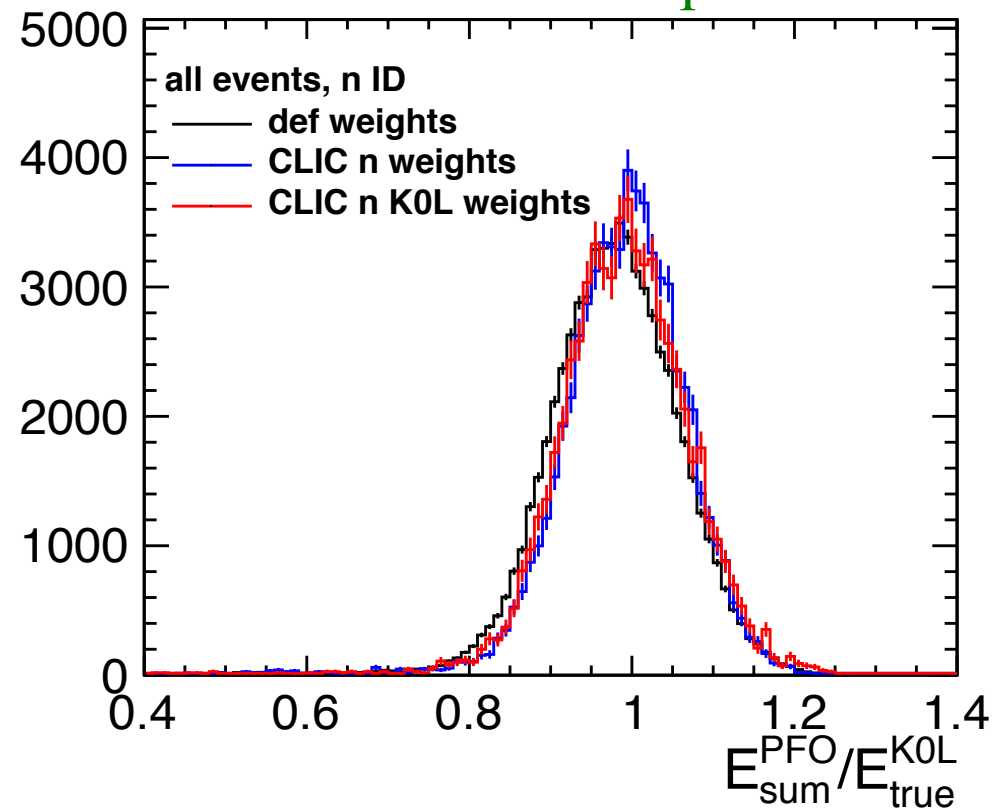


Recalibrate PandoraPFA for each of the software compensation (SWC) weights (neutrons, K0L, neutrons+K0L combined), apply n and n+K0L weights on Kaons and compare with previous SWC weights



Combined samples weight seems to work best

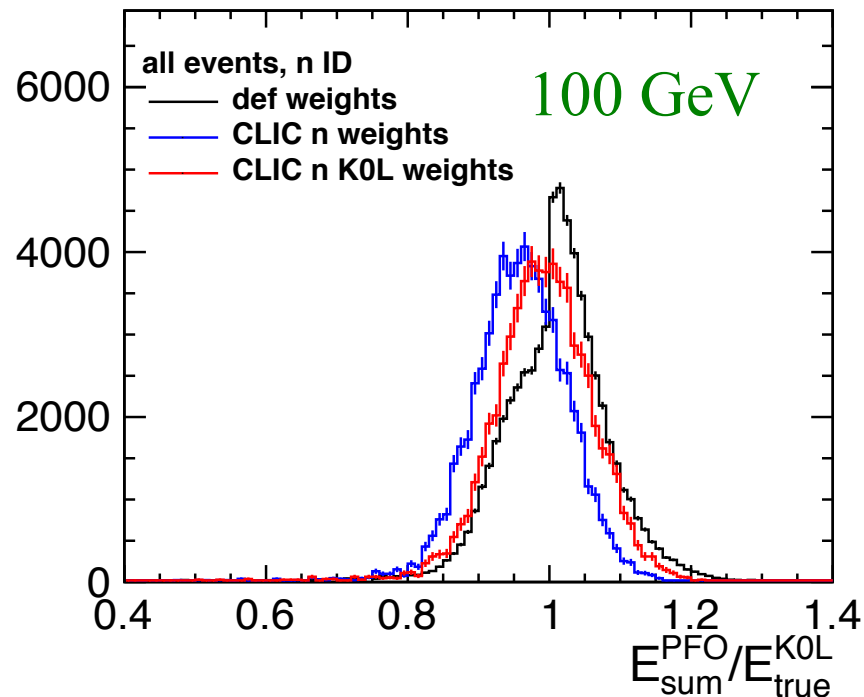
50 GeV: calibration point



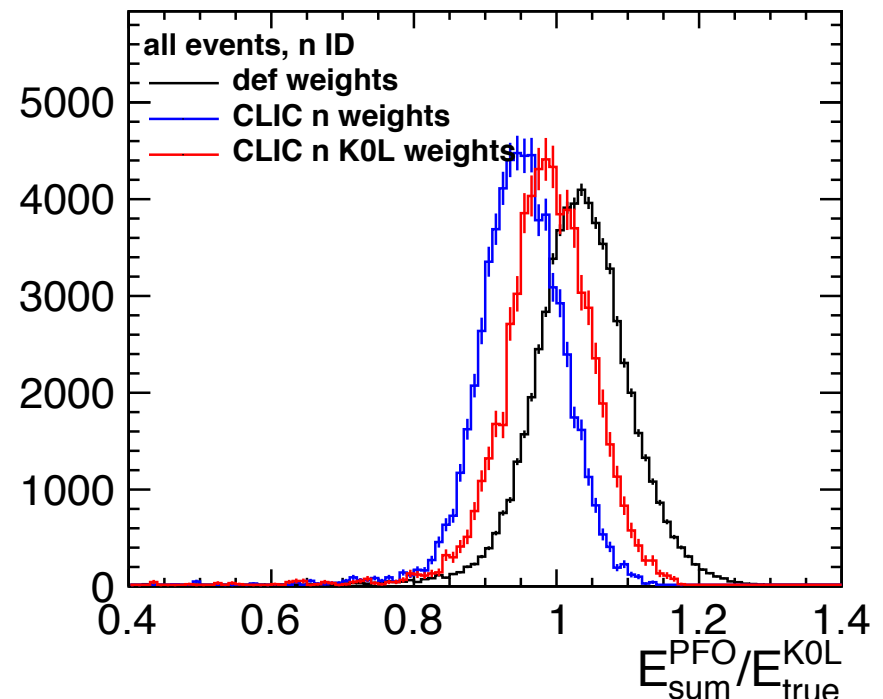
# Single Hadron response closures: low energy Kaons



Recalibrate PandoraPFA for each of the software compensation (SWC) weights (neutrons, K0L, neutrons+K0L combined), apply n and n+K0L weights on Kaons and compare with previous SWC weights



250 GeV

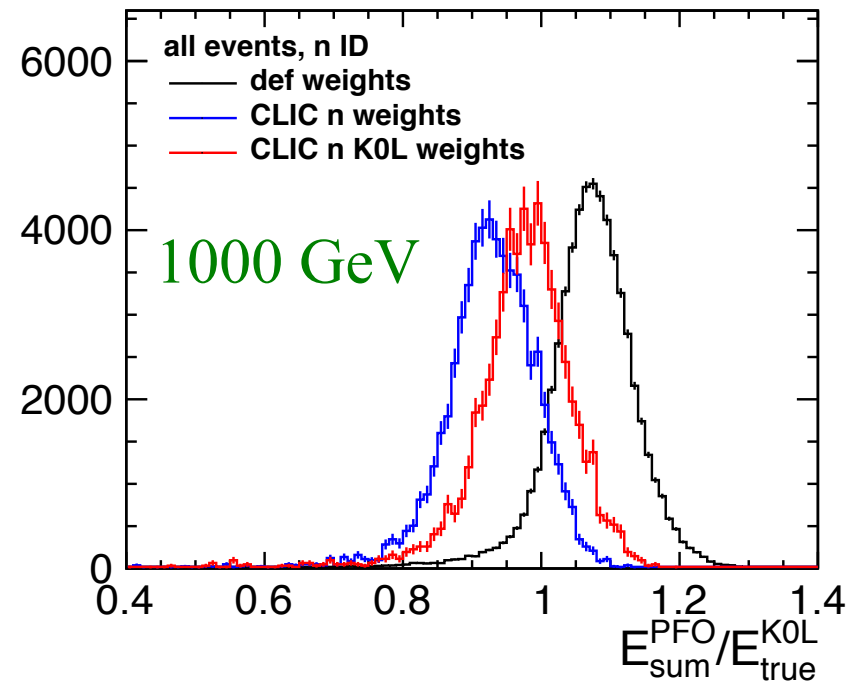
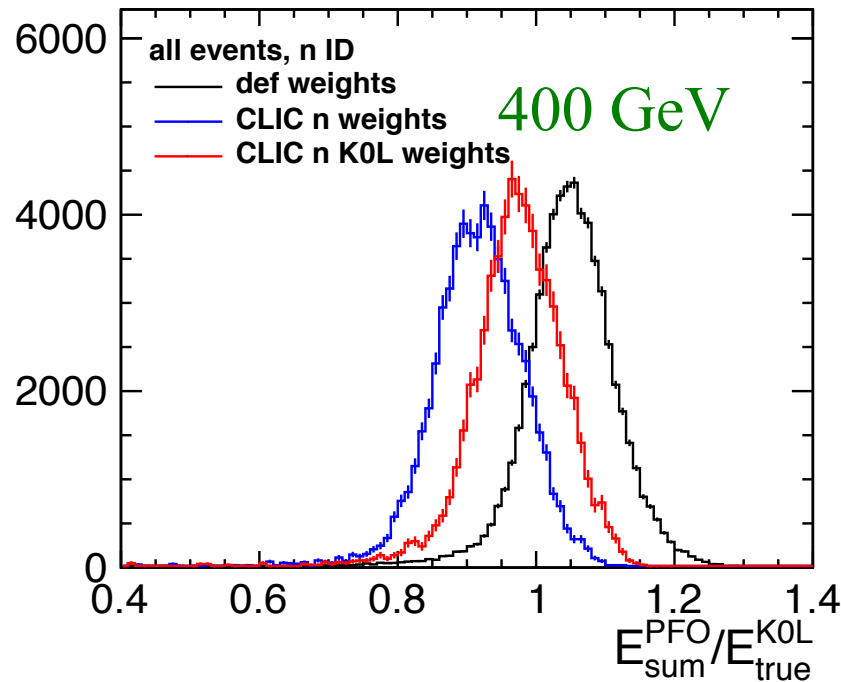


Combined samples weight works best, at 100 GeV default setting stops applying software compensation → weird shape of distribution

# Single Hadron response closures: high energy Kaons



Apply n and n+K0L weights on Kaons and compare with previous SWC weights

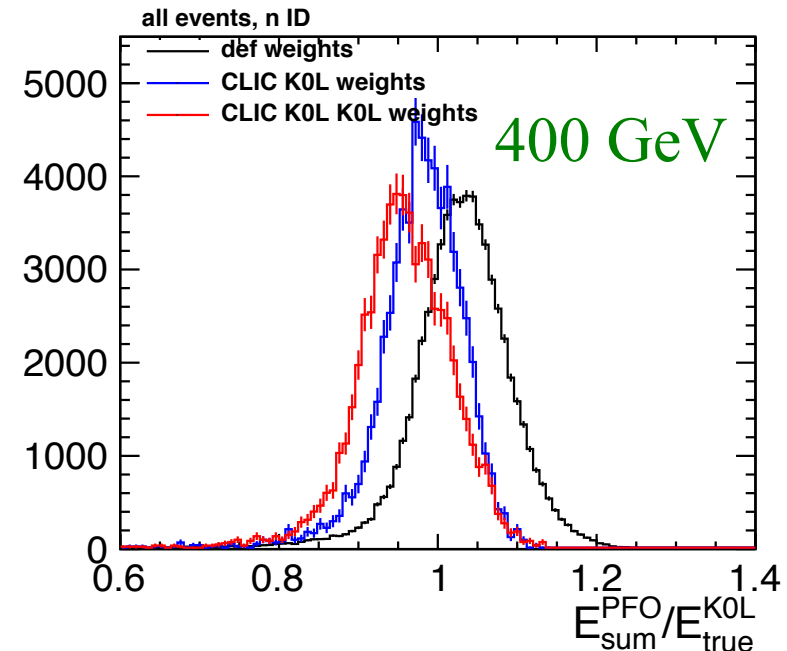
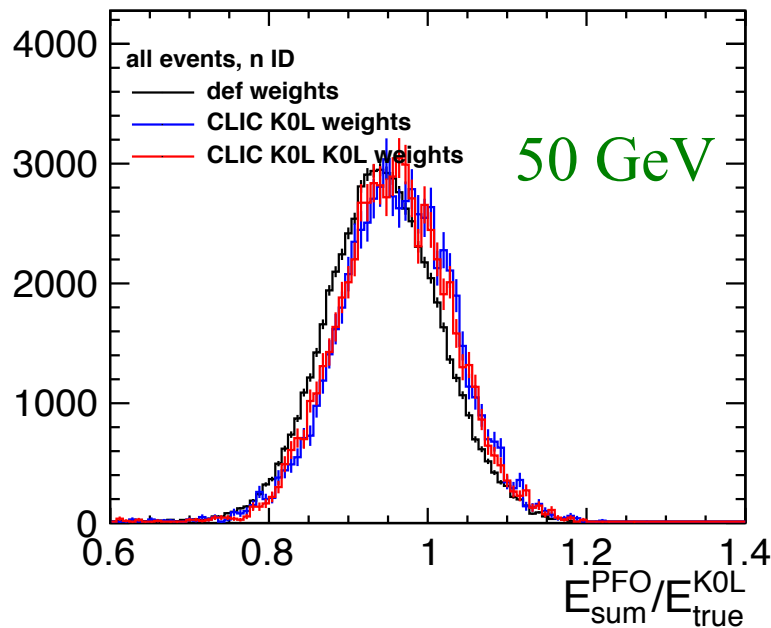


Best performance for Kaons using the weights of the combined sample, neutrons weights seem to be lower

# Single Hadron response closures: neutrons



apply K0L and n+K0L weights on neutrons and compare with previous SWC weights



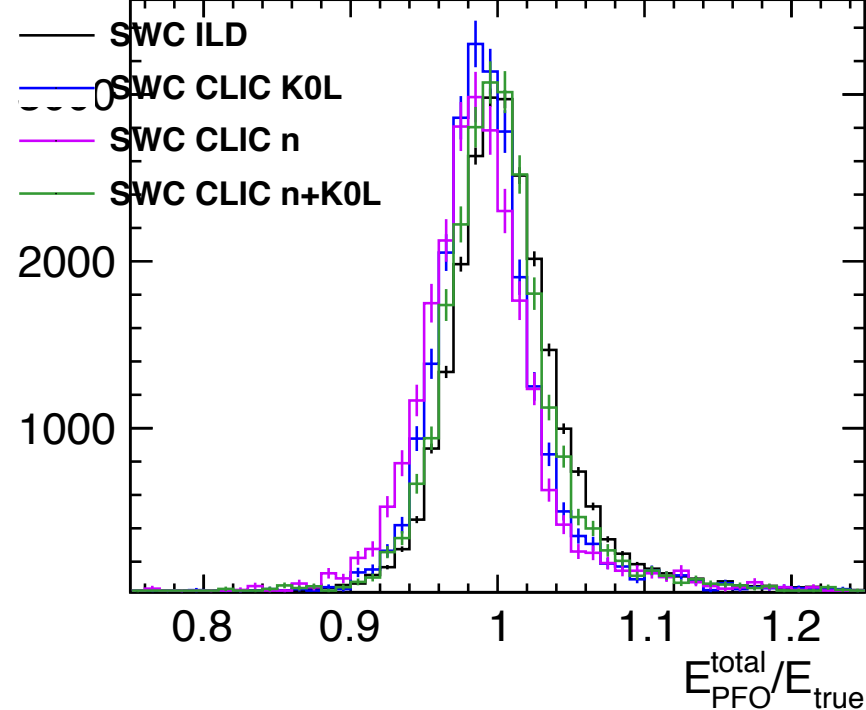
Response too low for all weights, K0L weights work better than from combined sample

# Outlook for Jet Energy Resolution

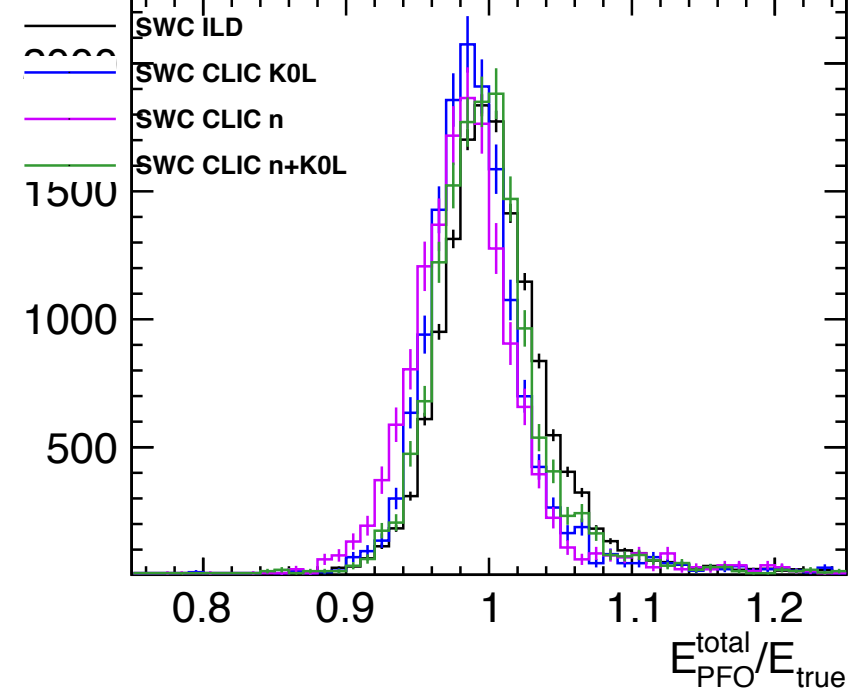
## Z to u/d/s sample at 1500 GeV



Z → uds, 1500 GeV



Z → uds, 1500 GeV,  $|\theta(j_1, j_2)| < 0.7$



Best values of means for n+K0L settings,  
Same for RMS values

mean/RMS 0.7 ILD 1.00531/0.0450967  
 mean/RMS 0.7 K0L 0.993323/0.0439417  
 mean/RMS 0.7 n 0.987313/0.0468662  
 mean/RMS 0.7 K0L+n 0.99924/0.0427059