

# Jet Error Parametrization and Application in Kinematic Fit

ILD software and analysis meeting

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**HELMHOLTZ**

RESEARCH FOR GRAND CHALLENGES



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**ilc**

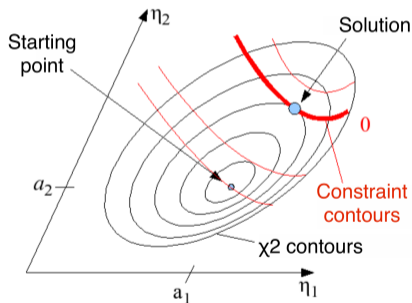


## Motivation

- ▶ Kinematic fit: a powerful mathematical tool to improve the measurements beyond the detector capability/resolution
  - ▶ Vary quantities within their uncertainties to satisfy the kinematic requirements
  - ▶ Provides better understanding on source of uncertainties
  - ▶ Evaluation of kinematic fit performance based on fit probability
- ▶ New production samples:
  - ▶ new software version: ILCSOFT v02-01-02
  - ▶  $e^+e^- \rightarrow \mu\bar{\mu}H$  with  $H \rightarrow b\bar{b}$  at  $\sqrt{s} = 250$  GeV
- ▶ ErrorFlow: use full covariance matrix of PFOs to estimate uncertainties on jet parameters

## Kinematic fit

- ▶ Kinematic fit: adjustment of measured quantities under certain kinematic constraints:
  - ▶ Energy and momentum conservation
  - ▶ Invariant masses of particles



- ▶ Minimize  $\chi^2$ :

$$\chi^2(\mathbf{a}, \boldsymbol{\xi}, \mathbf{f}) = (\boldsymbol{\eta} - \mathbf{a})^T \mathbf{V}^{-1}(\boldsymbol{\eta} - \mathbf{a}) - 2\boldsymbol{\lambda}^T \mathbf{f}(\mathbf{a}, \boldsymbol{\xi})$$

$\boldsymbol{\eta}$ : vector of measured kinematic variables ( $x$ )

$\mathbf{a}$ : vector of fitted quantities

$\boldsymbol{\xi}$ : vector of unmeasured kinematic variables

$\mathbf{V}$ : covariance matrix

$\boldsymbol{\lambda}$ : Lagrange multipliers

$\mathbf{f}(\mathbf{a}, \boldsymbol{\xi})$ : vector of constraints

- ▶ Measures of performance:

$F(\chi^2; \text{ndf})$ : cumulative  $\chi^2$  distribution for a certain ndf

$P(\chi^2)$ : fit probability

Exploit well-known initial state in  $e^+e^-$  colliders

Significantly improved estimation of the underlying kinematics of event

$$\text{pull}(x) = \frac{x_{\text{fitted}} - x_{\text{measured}}}{\sqrt{\sigma_{\text{fitted}}^2 - \sigma_{\text{measured}}^2}}$$
$$P(\chi^2) = 1 - F(\chi^2; \text{ndf})$$

# Error flow and application in kinematic fit

by Aliakbar Ebrahimi (DESY-THESIS-2017-045)

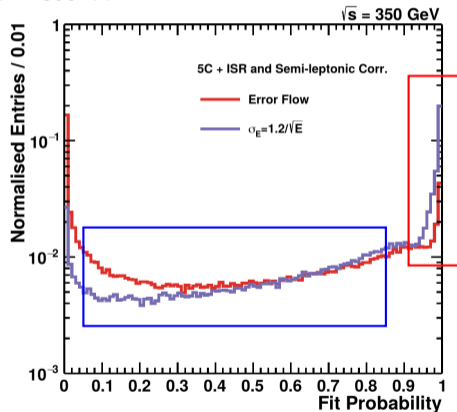
Jet specific energy resolution for  $e^+e^- \rightarrow ZH \rightarrow q\bar{q}b\bar{b}$  process at  $\sqrt{s} = 350$  GeV

- ▶ Full  $4 \times 4$  CovMatrix on 4-momentum of jets  $\sigma(\vec{p}, E)$ :
  - ▶  $\sigma_{Det}$ : computed using subdetector momentum/energy resolution
  - ▶  $\sigma_{Conf}$ : computed using jet energy and particle content (charged, neutral and photon)
  - ▶  $\sigma_\nu = 0.73 \cdot E_l$
  - ▶  $\sigma_{Had}$ ,  $\sigma_{Clus}$  are not accounted for error flow procedure yet.
- ▶ Fixed (and wide) angular resolution:  $\sigma_\theta = \sigma_\phi = 100$  mrad

Kinematic fit: vary jet quantities ( $E, \theta, \phi$ ) within uncertainties ( $\sigma_E, \sigma_\theta, \sigma_\phi$ )

Improved fit probability by applying Error Flow on jet energy

⇒ Further improvements by jet error parametrization



## Error parametrisations for jets

- ▶ Jets parametrized by  $(E_{jet}, \theta_{jet}, \phi_{jet}, \sigma_{E_{jet}}, \sigma_{\theta_{jet}}, \sigma_{\phi_{jet}}, m_{jet})$ :

$$(p_x, p_y, p_z, E, \text{CovMat}(\vec{p}, E)) \rightarrow (E, \theta, \phi, \sigma_E, \sigma_\theta, \sigma_\phi, m)$$

$$\tan \theta = \frac{\sqrt{p_x^2 + p_y^2}}{p_z}, \quad \tan \phi = \frac{p_y}{p_x}, \quad m = \sqrt{E^2 - (p_x^2 + p_y^2 + p_z^2)}$$

$\sigma_\theta^2$ : Error propagation of  $(\sigma_{p_x}^2, \sigma_{p_z}^2, \sigma_{p_z}^2, \dots)$ ,  $\sigma_\phi^2$ : Error propagation of  $(\sigma_{p_x}^2, \sigma_{p_y}^2, \dots)$

$$\sigma_{\theta_j}^2 = \left| \frac{\partial \theta}{\partial p_x} \right|^2 \sigma_{p_x}^2 + \left| \frac{\partial \theta}{\partial p_y} \right|^2 \sigma_{p_y}^2 + \left| \frac{\partial \theta}{\partial p_z} \right|^2 \sigma_{p_z}^2 + 2 \frac{\partial \theta}{\partial p_x} \frac{\partial \theta}{\partial p_y} \sigma_{p_x} \sigma_{p_y} + 2 \frac{\partial \theta}{\partial p_x} \frac{\partial \theta}{\partial p_z} \sigma_{p_x} \sigma_{p_z} + 2 \frac{\partial \theta}{\partial p_y} \frac{\partial \theta}{\partial p_z} \sigma_{p_y} \sigma_{p_z}$$

$$\sigma_{\phi_j}^2 = \left| \frac{\partial \theta}{\partial p_x} \right|^2 \sigma_{p_x}^2 + \left| \frac{\partial \phi}{\partial p_y} \right|^2 \sigma_{p_y}^2 + 2 \frac{\partial \theta}{\partial p_x} \frac{\partial \theta}{\partial p_y} \sigma_{p_x} \sigma_{p_y}$$

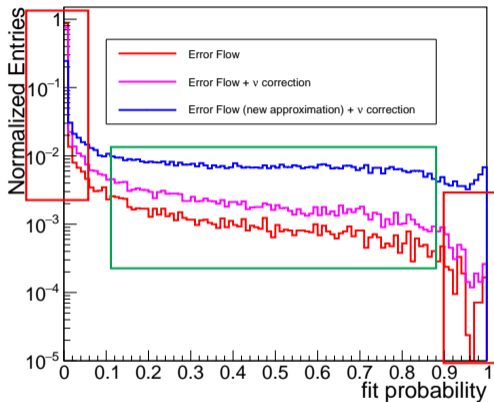
$$\frac{\partial \theta}{\partial p_x} = \frac{p_x p_z}{p^2 p_T} \quad \checkmark, \quad \frac{\partial \theta}{\partial p_y} = \frac{p_y p_z}{p^2 p_T} \quad \checkmark, \quad \frac{\partial \theta}{\partial p_z} = -\frac{p_T}{p^2} \quad \checkmark$$

$$\frac{\partial \phi}{\partial p_x} = -\frac{p_y}{p_x^2 + p_y^2} \quad \checkmark, \quad \frac{\partial \phi}{\partial p_y} = \frac{p_x}{p_x^2 + p_y^2} \quad \checkmark$$

$\sigma_\theta$  and  $\sigma_\phi$  are not fixed  $\Rightarrow$  Angular resolutions are calculated for each individual jet (fixed bugs)

Planned TO DO: input full CovMatrix to fit objects

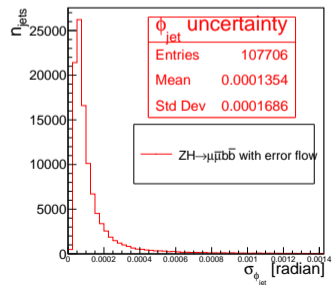
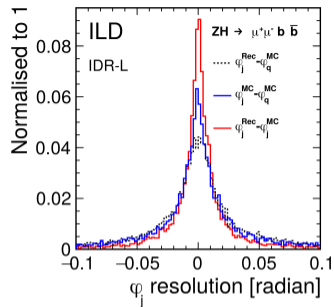
## New approximation on jet angle uncertainties



Improved fit probability using individual jet angle resolution

new approximation:  $100 \times (\sigma_{\theta_{jet}}, \sigma_{\phi_{jet}})$

Error Flow under-estimates the uncertainties on jet angles.



## jet uncertainties (CovMat) in ErrorFlow

- ▶ charged PFOs (identified by charge of PFO  $\neq 0$ ):  
PFO CovMat elements are added to the corresponding jet CovMat elements
- ▶ neutral PFOs (identified by charge of PFO = 0):  
only  $\sigma_{E_{PFO}}^2$  is added to  $\sigma_{E_{jet}}^2$   
 $\sigma_{E_{PFO}}^2$  is calculated using  $E_{PFO}$  and numerical parameters:  
$$\sigma_{E_{PFO}}^2 = a^2 \cdot E_{PFO} + c^2 \cdot E_{PFO}^2$$
  - ▶ photons:  $a_{ECAL} = 0.16$  and  $c_{ECAL} = 0.01$  (doi:10.1016/j.nima.2009.07.026)
  - ▶ hadrons:  $a_{HCAL} = 0.50$  and  $c_{HCAL} = 0.01$  (2012 JINST 7 P09017)

ErrorFlow issues:

- ▶ full CovMat of neutral PFOs are not included
- ▶ neutral PFOs decaying to TWO charged particles can be treated as charged PFOs:  
 $\gamma \rightarrow e^+e^-$  and  $K_S^0 \rightarrow \pi^+\pi^-$

# Physics questions in PandoraPFOs collection

Neutral PFOs are assumed massless but identified as massive particle:  $E = |\vec{p}|$  and  $M \neq 0$

event #1 in: /pnfs/desy.de/l1c/prod/l1c/mc-opt/l1d/dst-merged/250-SetA/test/ILD\_L5\_o1\_v02\_nobg/v02-01/rv02-01.sv02-01.nILD\_L5\_o1\_v02\_nobg.E250-SetA.I401006.Pe2e2h.eL.pR.n000.d\_dstn\_14717\_1.sl.cio

collection name : PandoraPFOs

parameters:

----- print out of ReconstructedParticle collection -----

```
[ id ] | com | type | momentum ( px,py,pz ) | energy | mass | charge | position ( x,y,z ) | pIdUsed | GoodnessOfPID |
-----|-----|-----|-----|-----|-----|-----|-----|-----|-----|
[00001407] | 0 | 2112 | +6.98e-02, -4.04e-01, +3.07e-01 | 5.13e-01 | 9.40e-01 | 0.00e+00 | +3.17e+02, -1.84e+03, +1.40e+03 | 00000000 | 0.00e+00 |
```

covariance( px,py,pz,E ) : (3.43e-03, -1.98e-02, 1.15e-01, 1.51e-02, -8.74e-02, 6.65e-02, 2.52e-02, -1.46e-01, 1.11e-01, 1.85e-01)

particles ( [ id ] ):

tracks ( [ id ] ):

clusters ( [ id ] ): [00001124]

particle ids ( [id], PDG, (type)):

Type	PDG	Likelihood	Algorithn	type
0	0	0.00e+00		5
0	0	0.00e+00		6
0	0	0.00e+00		7
0	0	0.00e+00		8

vertices: startVertex( id:[ 00000000id\_aRP: 00000000 ] endVertex( id:[00000000], id\_aRP:[00000000]

collection name : PandoraClusters

parameters:

----- print out of Cluster collection -----

```
[ id ] | type | energy | energyerr | position ( x,y,z ) | ltheta | lphi |
-----|-----|-----|-----|-----|-----|-----|
[00001124] | 0 | +5.127e-01 | +4.299e-01 | +3.170e+02, -1.836e+03, +1.396e+03 | +8.556e-01 | -1.552e+00 |
errors (6 pos)/( 3 dir): (+2.169e+01, -2.567e-01, +1.287e+02, +3.989e+00, -1.103e+02, +9.746e+01, ) /
(+3.574e-02+4.888e-03+7.600e-04)
```

clusters(e):

subdetector energies : +4.369e-01, +0.000e+00, +0.000e+00, +0.000e+00, +0.000e+00, +0.000e+00,

needs recalibration of Pandora  $\Rightarrow$  run standard JER and check the impact of PID (mass) assigned to each neutral hadron, not feasible at this stage!



Bug in CovMat of neutral PFOs:

- ▶ wrong CovMat calculation in AddClusterProperties for neutral PFOs

Jacobian as  $\frac{\partial(\vec{p}, E)}{\partial(\vec{r}, E)}$  (for cluster errors):

$$J_C = \begin{pmatrix} \frac{\partial p_x}{\partial x} & \frac{\partial p_y}{\partial x} & \frac{\partial p_z}{\partial x} & \frac{\partial E}{\partial x} \\ \frac{\partial p_x}{\partial y} & \frac{\partial p_y}{\partial y} & \frac{\partial p_z}{\partial y} & \frac{\partial E}{\partial y} \\ \frac{\partial p_x}{\partial z} & \frac{\partial p_y}{\partial z} & \frac{\partial p_z}{\partial z} & \frac{\partial E}{\partial z} \\ \frac{\partial p_x}{\partial E} & \frac{\partial p_y}{\partial E} & \frac{\partial p_z}{\partial E} & \frac{\partial E}{\partial E} \end{pmatrix} = \begin{pmatrix} E \frac{r^2 + x^2}{r^3} & E \frac{x \cdot y}{r^3} & E \frac{x \cdot z}{r^3} & 0 \\ E \frac{x \cdot y}{r^3} & E \frac{r^2 + y^2}{r^3} & E \frac{y \cdot z}{r^3} & 0 \\ E \frac{x \cdot z}{r^3} & E \frac{y \cdot z}{r^3} & E \frac{r^2 + z^2}{r^3} & 0 \\ \frac{x}{r} & \frac{y}{r} & \frac{z}{r} & 1 \end{pmatrix}$$

$$|\vec{p}| = E, p_x = E \frac{x}{\sqrt{x^2 + y^2 + z^2}}, r = \sqrt{x^2 + y^2 + z^2} \Rightarrow \frac{\partial p_x}{\partial x} = E \frac{r^2 - x^2}{r^3}, \frac{\partial p_x}{\partial y} = -E \frac{xy}{r^3}, \frac{\partial p_x}{\partial z} = -E \frac{xz}{r^3}$$

$$\Rightarrow J_C = \begin{pmatrix} E \frac{r^2 - x^2}{r^3} & -E \frac{x \cdot y}{r^3} & -E \frac{x \cdot z}{r^3} & 0 \\ -E \frac{x \cdot y}{r^3} & E \frac{r^2 - y^2}{r^3} & -E \frac{y \cdot z}{r^3} & 0 \\ -E \frac{x \cdot z}{r^3} & -E \frac{y \cdot z}{r^3} & E \frac{r^2 - z^2}{r^3} & 0 \\ \frac{x}{r} & \frac{y}{r} & \frac{z}{r} & 1 \end{pmatrix}$$

- CovMat for neutral PFOs (without track):

$$C_p = J_C^T C_{RC} J_C$$

$C_p$ : CovMatrix of  $(\vec{p}, E)$ ,  $C_{RC}$ : cluster errors (cluster energy error and cluster position ( $x$ ,  $y$  and  $z$ ) errors),

$J_C$ : Jacobian matrix (cluster parameters)

$$C_{RC} = \begin{pmatrix} \sigma_x^2 & \sigma_{xy} & \sigma_{xz} & \sigma_{xE} \\ \sigma_{xy} & \sigma_y^2 & \sigma_{yz} & \sigma_{yE} \\ \sigma_{xz} & \sigma_{yz} & \sigma_z^2 & \sigma_{zE} \\ \sigma_{xE} & \sigma_{yE} & \sigma_{zE} & \sigma_E^2 \end{pmatrix} = \begin{pmatrix} \sigma_x^2 & \sigma_{xy} & \sigma_{xz} & 0 \\ \sigma_{xy} & \sigma_y^2 & \sigma_{yz} & 0 \\ \sigma_{xz} & \sigma_{yz} & \sigma_z^2 & 0 \\ 0 & 0 & 0 & \sigma_E^2 \end{pmatrix}$$

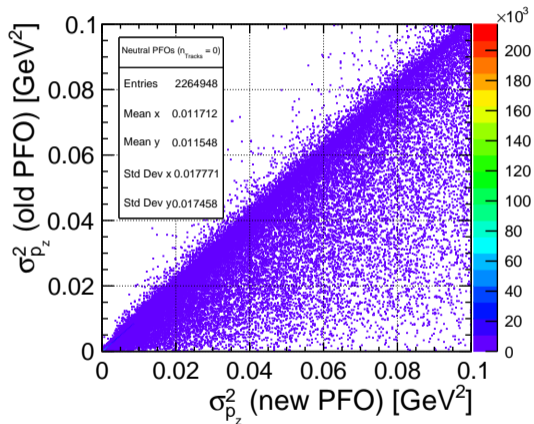
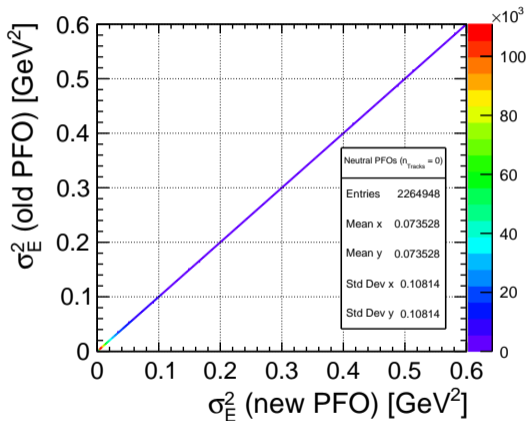
$\sigma_x^2, \sigma_{xy}, \dots$  from cluster position errors

$\sigma_E^2$  from cluster energy error ( $\sigma_E$ )

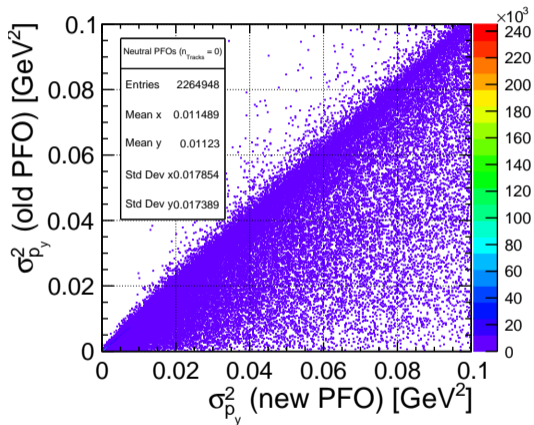
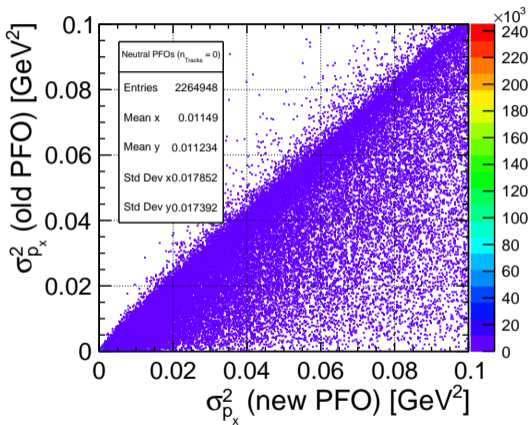
implemented in AddFourMomentumCovMatAllPFOs

(<https://github.com/yradkhorrani/AddFourMomentumCovMatAllPFOs>)

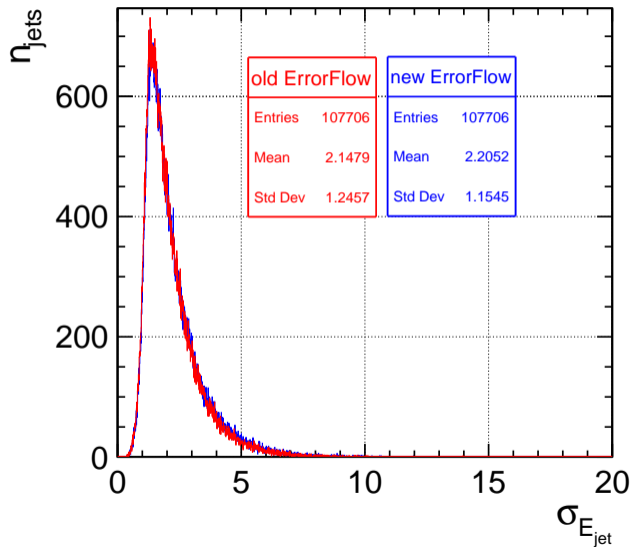
CovMat elements with new calculations:



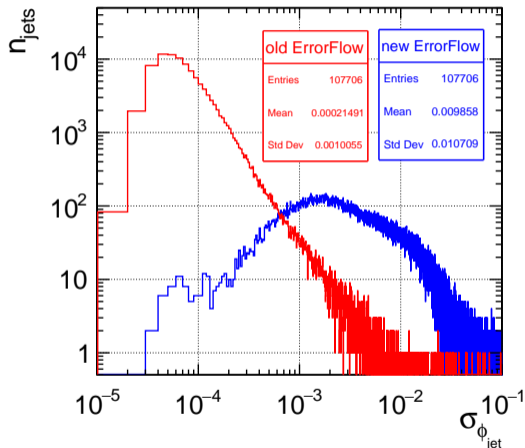
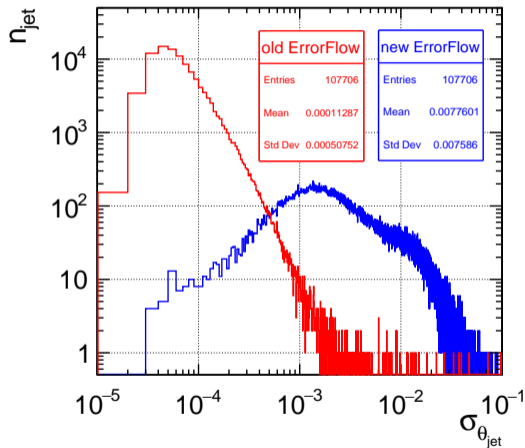
CovMat elements with new calculations:



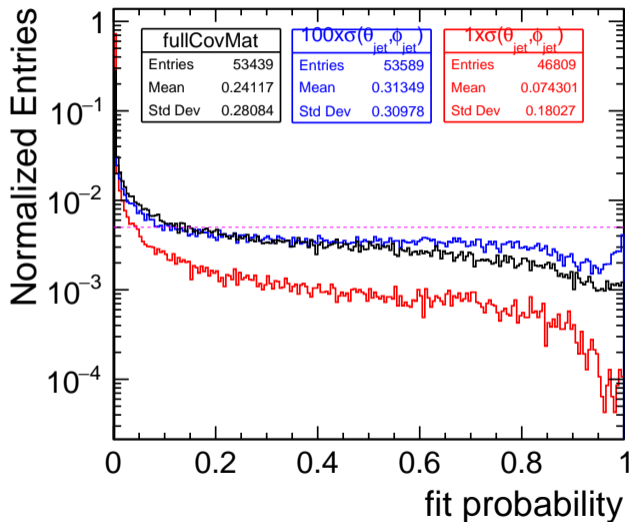
uncertainty on jet energy is unchanged (as expected) with new ErrorFlow calculation



uncertainties on jet angles are improved (worth factor of  $\sim 100$ ) with new ErrorFlow calculation



improved fit probability with new ErrorFlow calculation



## Summary

- ▶ uncertainties on jet angles are parametrized for individual jets (new in MarlinKinFit)
  - ▶ neutral PFOs with TWO tracks: CovMat is included in Error Flow
  - ▶ neutral PFOs without track: fixed bug in AddClusterProperties
- ▶ improved fit probability with updated resolution on jet angles

open issues:

- ▶ Jacobian for neutral PFOs: with  $E$  or  $p$ ? (preliminary with  $p$ )
- ▶ Further improvement on error estimation:
  - ▶ Full  $(E, \vec{p})$  covariance matrix for JetFitObject (include  $\sigma_{p_x E}, \sigma_{p_y E}, \sigma_{p_z E}$ )
  - ▶ Estimate parton shower & hadronisation effects
  - ▶ Use proper masses, momenta and CovMatrices of PFOs from tracks refitted with correct mass hypothesis