

# ErrorFlow: Jet Error Estimation for Kinematic Fitting in Particle Flow Detectors at Future Higgs Factories

First ECFA Workshop on  $e^+e^-$  Higgs/EW/Top Factories

Jenny List<sup>1</sup>, Yasser Radkhorrami<sup>1,2</sup>

<sup>1</sup>DESY, Hamburg

<sup>2</sup>Universität Hamburg, Hamburg

October 06, 2022



CLUSTER OF EXCELLENCE  
QUANTUM UNIVERSE

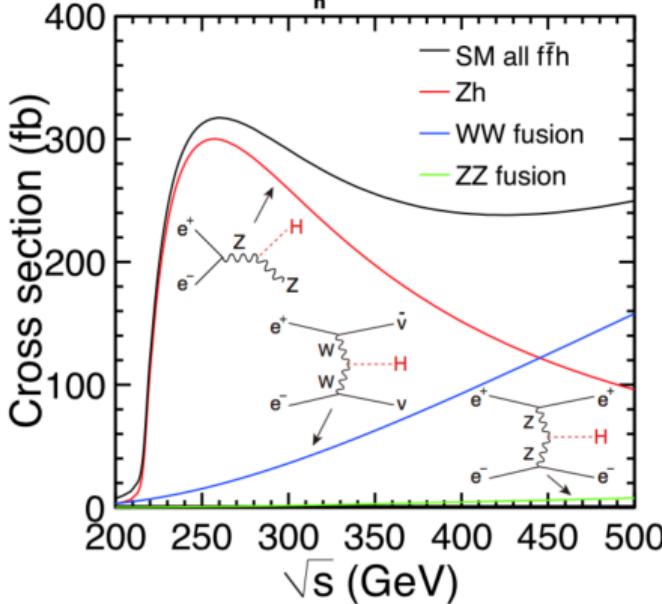
HELMHOLTZ  
RESEARCH FOR GRAND CHALLENGES



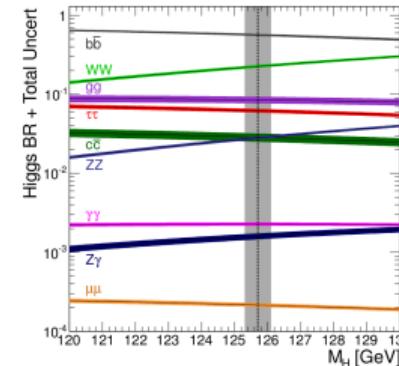
# Higgs production mechanisms and decay modes at $e^+e^-$ colliders

- Higgs strahlung is dominant Higgs production mechanism at 250 GeV

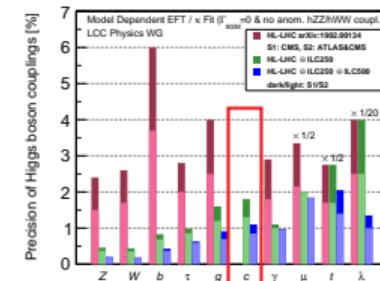
$$P(e^-, e^+) = (-0.8, 0.3), M_h = 125 \text{ GeV}$$



- Most frequent Higgs decay mode:  $H \rightarrow b\bar{b}$



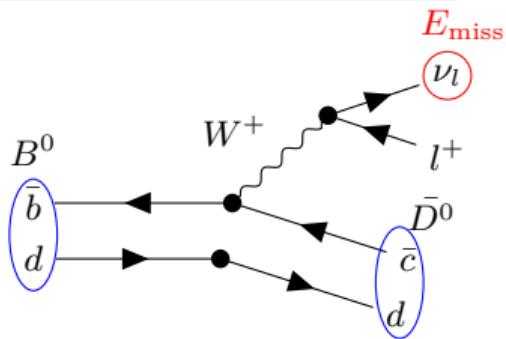
- Extremely challenging in Hadron colliders:  $H \rightarrow c\bar{c}$



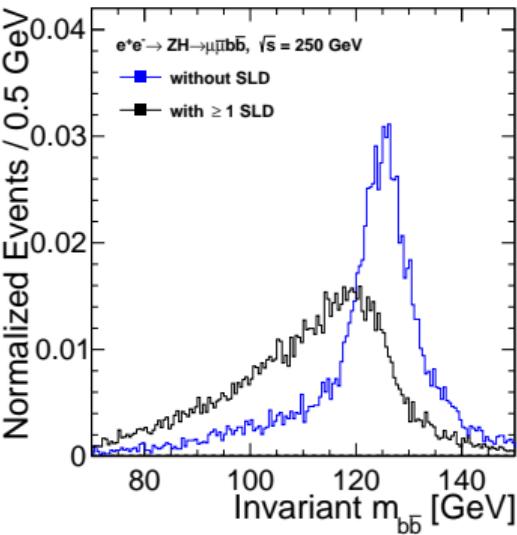
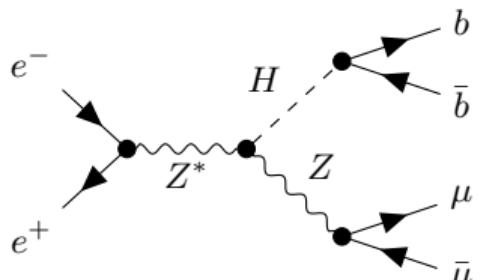
## Semi-leptonic $b$ / $c$ decays

- Number of B-/C-hadron semi-leptonic decays (SLD) in  $e^+e^- \rightarrow ZH \rightarrow \mu\bar{\mu}bb$  events

		nBSLD		
		0	1	2
nCSLD	0	34%	24%	4%
	1	18%	12%	2%
	2	3%	2%	0%



- Mis-reconstruction of  $b\bar{b}$  invariant mass due to **missing neutrino energy** from semi-leptonic decays
- Can the **missing momentum** be retrieved from event and decay kinematics in a highly granular detector?



# Concept of $\nu$ -correction in a semi-leptonic decay

- ▶ Find heavy-quark jets: Identify  $b$  or  $c$  jet  $\rightarrow$  flavour tag
- ▶ Find semi-leptonic decay(s): Identify lepton in jet if present  
 $\rightarrow$  possible using detector's high granularity

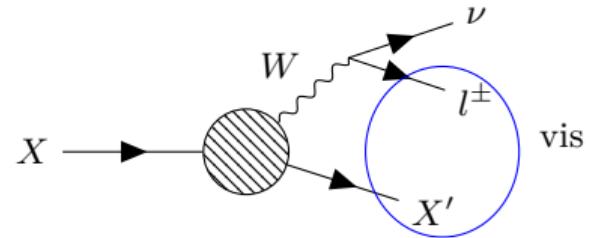
See talk by L. Reichenbach

- ▶ Estimate neutrino energy from decay kinematics:
  - ▶ Assign  $B^0$  or  $D^0$  meson mass to mother hadron.
  - ▶ Reconstruct flight direction of mother hadron from position of primary and secondary vertex.
  - ▶ Calculate neutrino momentum: up to 2-fold ambiguity.
- ▶ As proof-of-principle: CHEAT from MC truth

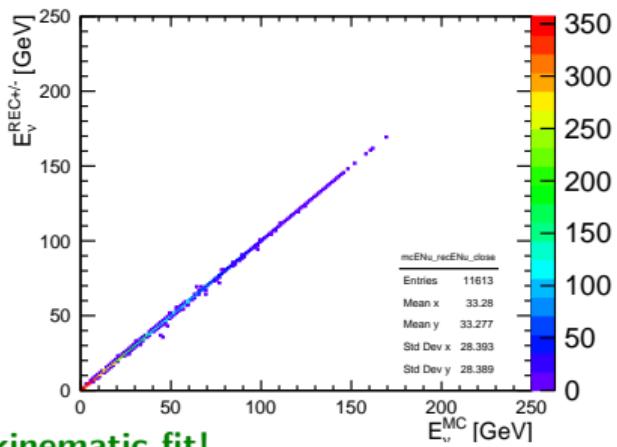
arXiv:2105.08480

The neutrino momentum can be determined up to a two-fold ambiguity

Can we use overall event kinematics to decide between solutions?  $\Rightarrow$  kinematic fit!

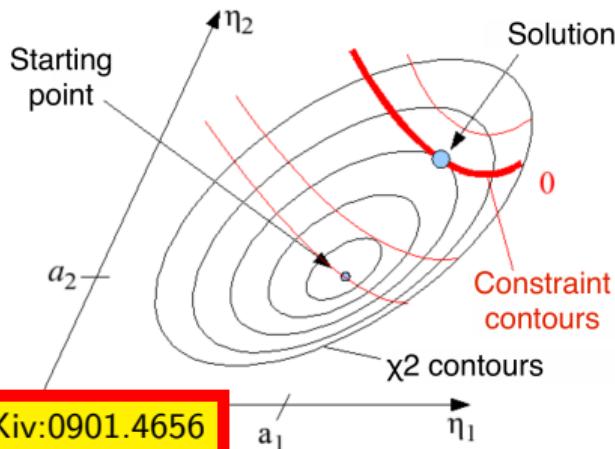


- ▶ Closure test: fully cheated information ( $e^+e^- \rightarrow b\bar{b}$  at  $\sqrt{s} = 500$  GeV)



# Kinematic fit

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



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

⇒ need error parametrization, in particular for jets

- Minimize  $\chi^2$ :

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

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

$a$ : vector of fitted quantities

$\xi$ : vector of unmeasured kinematic variables

$V$ : **covariance matrix**

$\lambda$ : Lagrange multipliers

$f(a, \xi)$ : vector of constraints



# Jet specific error parameterisation, ErrorFlow

Parametrize sources of uncertainties (assumed uncorrelated) in jet parameters measurements (ErrorFlow) :

$$\sigma_{\text{jet}} = \sigma_{\text{Det}} \oplus \sigma_{\text{Conf}} \oplus \sigma_{\nu} \oplus \sigma_{\text{Clus}} \oplus \sigma_{\text{Had}} \oplus \sigma_{\text{Overlay}}$$

- ▶  $\sigma_{\text{Det}}$ : Detector resolution using track and cluster parameters
- ▶  $\sigma_{\text{Conf}}$ : Particle confusion in Particle Flow Algorithm  
Estimated based on jet energy and neutral hadron / photon energy fractions
- ▶  $\sigma_{\nu}$ : Semi-leptonic decays: error propagation from neutrino correction
- ▶  $\sigma_{\text{Clus}}$ : Misassignment of particles in the jet clustering, has not been included yet
- ▶  $\sigma_{\text{Had}}$ : Mismodeling of QCD effects in parton shower and hadronization, has not been included yet
- ▶  $\sigma_{\text{Overlay}}$ : Uncertainties due to imperfect  $\gamma\gamma \rightarrow$  low  $p_T$  hadrons, has not been included yet

DESY-THESIS-2017-045



## Pandora treatment with PFOs

- ▶ Charged PFOs:
  - ▶ four-momentum: calculated using track parameters
  - ▶ uncertainties: propagated from track fit covariance matrix
- ▶ Neutral PFOs:
  - ▶ Cluster energy is assigned to PFO energy (assumed massless);  $E_{\text{PFO}} = |\vec{p}_{\text{PFO}}| = E_{\text{clu}}$
  - ▶ photons: OK ( $m_\gamma = 0$ )
  - ▶ neutral hadrons: identified as neutron  $\Rightarrow m_n$  is set for PFO  $\Rightarrow$  **inconsistent 4-momentum!**

CovMat of Neutral PFO: calculated using inconsistent 4-momentum

- ▶ energy error: from calorimeter intrinsic energy resolution
- ▶ angular uncertainties: from cluster shape (least correlation with cluster energy)

inconsistent four-momentum of neutral hadrons  $\Rightarrow$  wrong error propagation

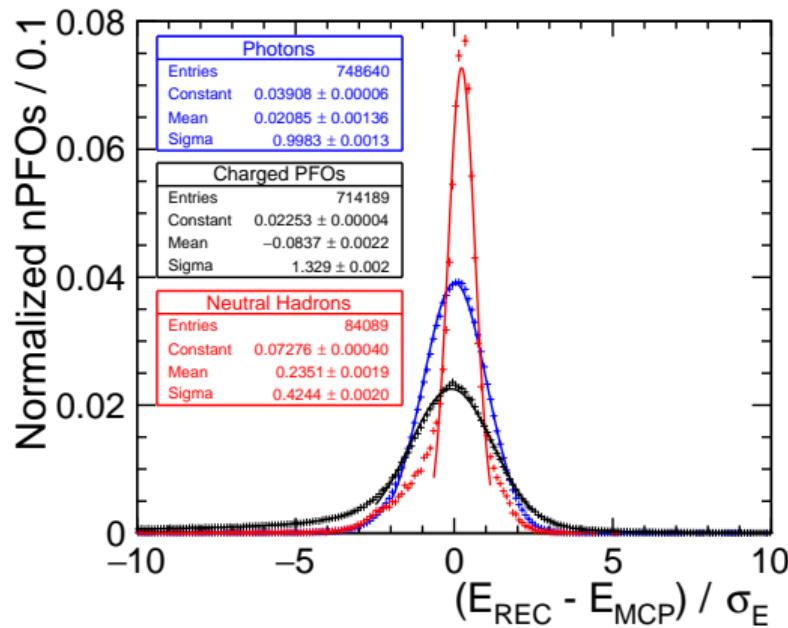


# PFO-level detector resolution, $\sigma_{\text{Det}}$

## Energy

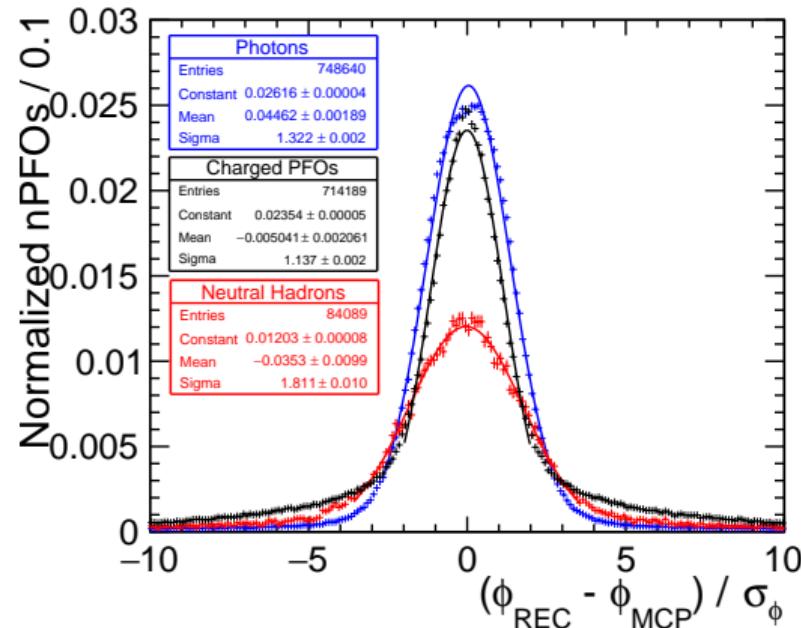
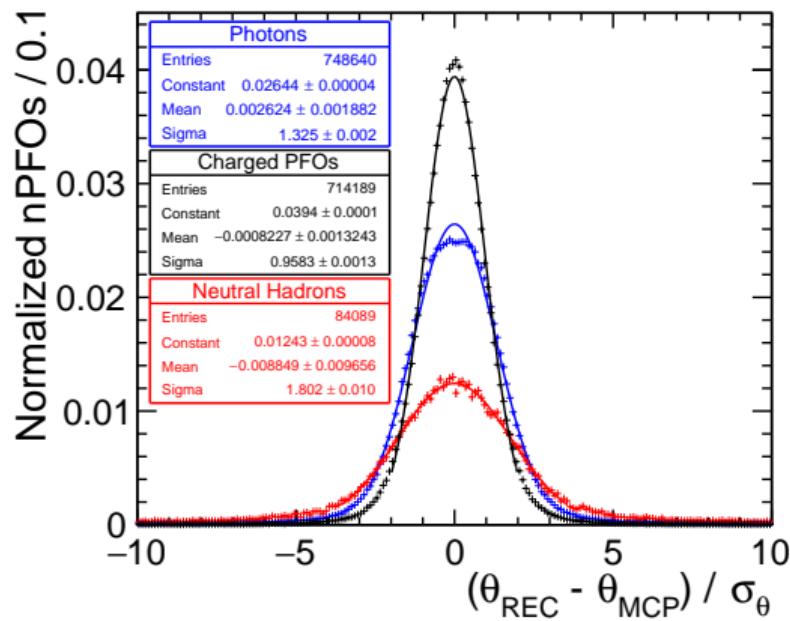
Error estimation in PFO level:

- ▶ **Charged PFOs**: uncertainties propagated from track fit covariance matrix
  - ▶ uncertainties 30% too small
- ▶ **Photons**: energy error is perfectly modeled.  
( $\sigma \sim 1$ )
- ▶ **Neutral Hadrons**: energy error from calorimeter intrinsic energy resolution.



# PFO-level detector resolution, $\sigma_{\text{Det}}$ for Neutral PFOs

$\theta$  and  $\phi$ : quantities with as little correlation to PFO/cluster energy as possible.



underestimated  $\sigma_\theta$  and  $\sigma_\phi$  by factor  $\sim 30\%$  (for photons) and  $\sim 80\%$  (for neutral hadrons)

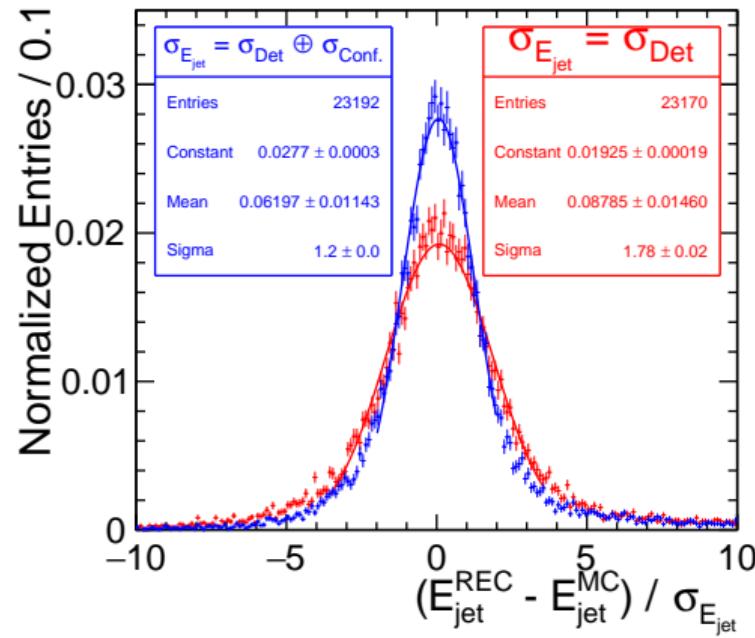


# Uncertainties in jet-level

Propagation of errors from PFOs to jets:

- ▶ Transform the covariance matrix of each PFO ( $E, x, y, z$  for clusters, track parameters for charged) to  $(E, p_x, p_y, p_z)$
- ▶ Add up scaled ( $S^2 \times$ ) covariance matrices of all PFOs:  
 $S = 1.3$  (photons),  $S = 1.8$  (neutral hadrons)
- ▶ Add confusion term to covariance matrix
  - ▶ calculate  $\sigma_{E_{jet}}^{\text{Conf.}}$  using jet energy composition
  - ▶ propagate to all CovMat elements by forcing  
 $\sigma_{\theta_{jet}}^{\text{Conf.}} = \sigma_{\phi_{jet}}^{\text{Conf.}} = 0$
- ▶ Transform to  $(E_{jet}, \theta_{jet}, \phi_{jet}, m_{jet}, \sigma_{E_{jet}}, \sigma_{\theta_{jet}}, \sigma_{\phi_{jet}})$  in kinematic fit

Confusion term improves the estimate of the jet energy uncertainty, but not quite enough  $\Rightarrow$  need adjustment  
 $\Rightarrow$  use scaling factor 1.2 (for  $\sigma_{E_{jet}}$ ) in kinematic fit



# Application of kinematic fit to $e^+e^- \rightarrow ZH \rightarrow \mu\bar{\mu}b\bar{b}$ events

Parameters of jets and leptons are varied within their uncertainties to satisfy 5 constraints:  
Conservation of momentum (hard constraints):

- ▶  $p_x$ :  $e^+e^-$  crossing angle: 14 mrad

$$\Sigma p_x = \sqrt{s} \times \sin 0.007 \approx 1.75 \text{ GeV}$$

- ▶  $p_y$ :  $\Sigma p_y = 0$

- ▶  $p_z$ :  $\Sigma p_z = 0$

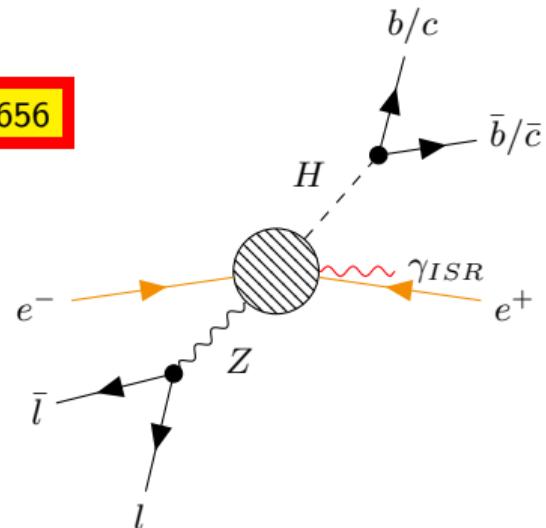
arXiv:0901.4656

Conservation of total energy (hard constraint):

- ▶  $E_{lab} = 2\sqrt{(\frac{\sqrt{s}}{2})^2 + (\Sigma p_x)^2}$

Constrain di-muon mass to agree with  $m_Z$  within its natural width  
(soft constraint):

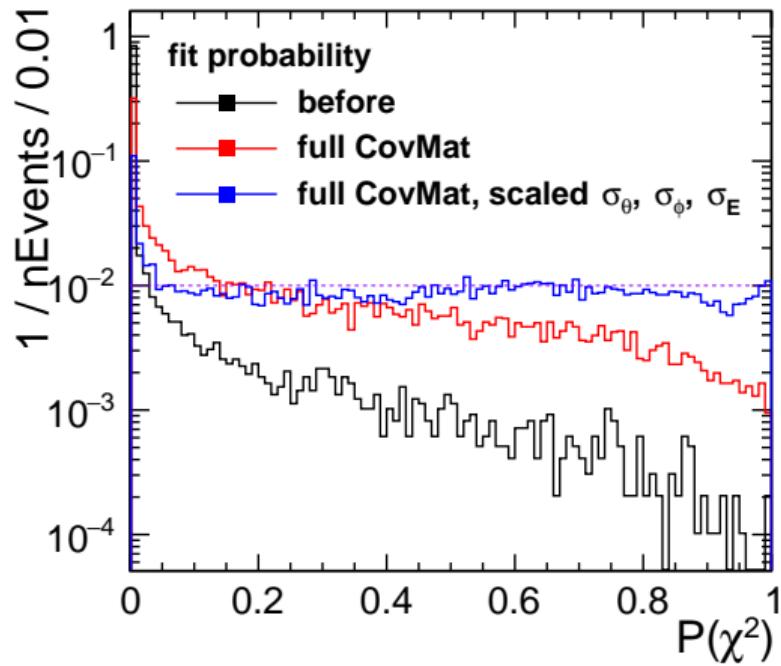
- ▶  $m_Z = 91.2 \text{ GeV}$ ,  $\sigma_{m_Z} = \frac{2.4952}{2}$



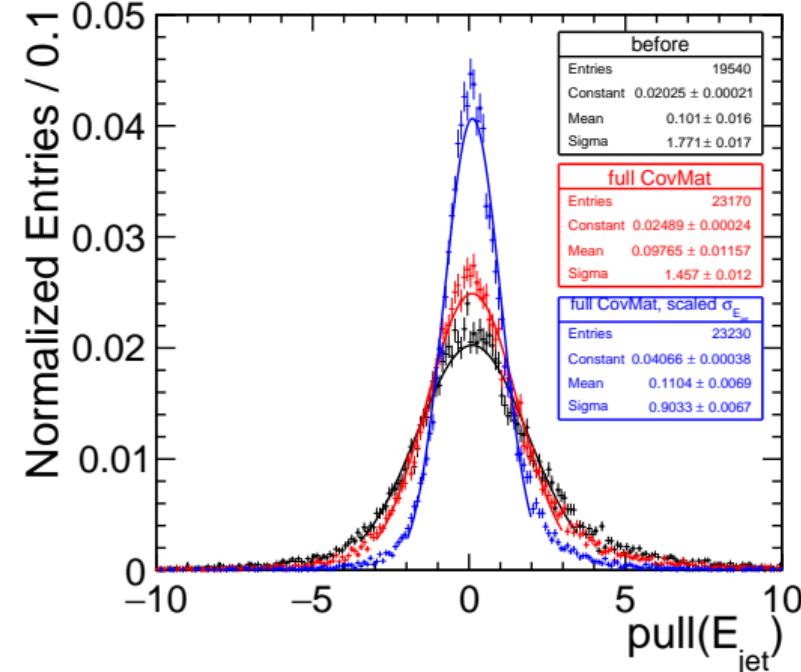
# Kinematic fit performance in $e^+e^- \rightarrow ZH \rightarrow \mu\bar{\mu}bb$ at $\sqrt{s} = 250$ GeV

without semi-leptonic decays

## ► fit probability



## ► pull distribution

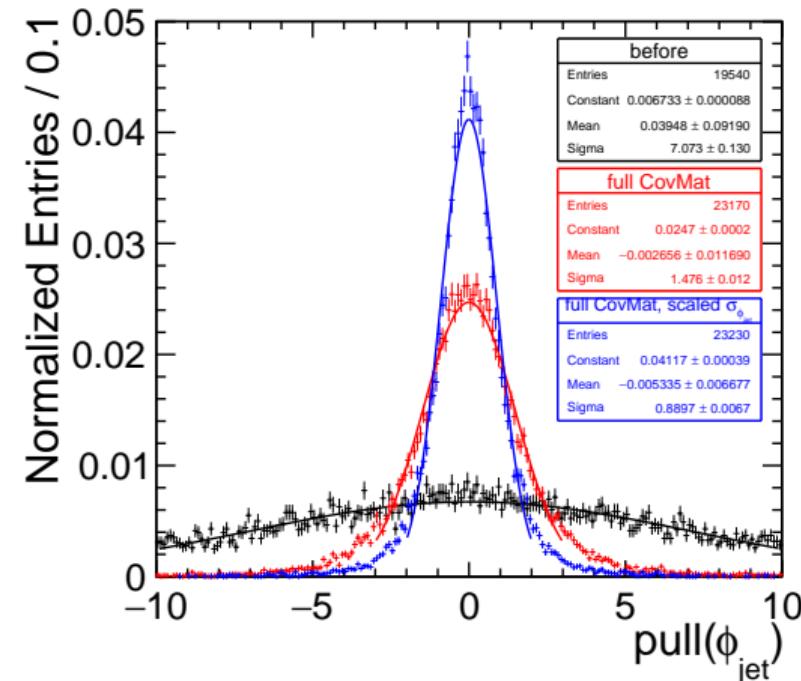
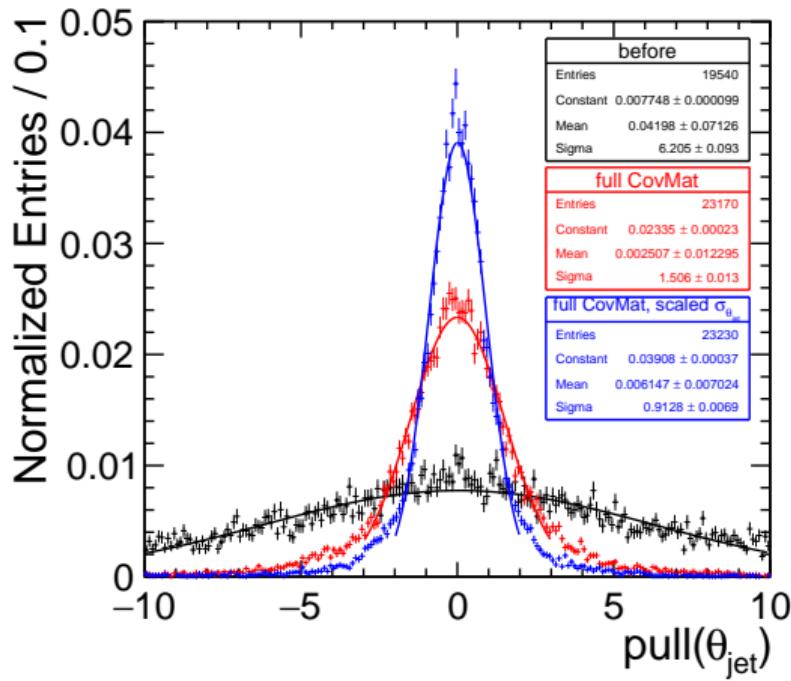


Improved kinematic fit performance with full CovMat of jets + scaled jet energy uncertainty



# Kinematic fit performance in $e^+e^- \rightarrow ZH \rightarrow \mu\bar{\mu}bb$ at $\sqrt{s} = 250$ GeV (cntd.)

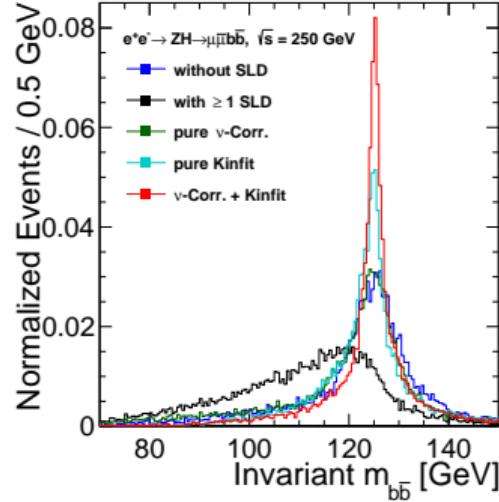
without semi-leptonic decays



Improved kinematic fit performance with full CovMat of jets + scaled jet angular uncertainties

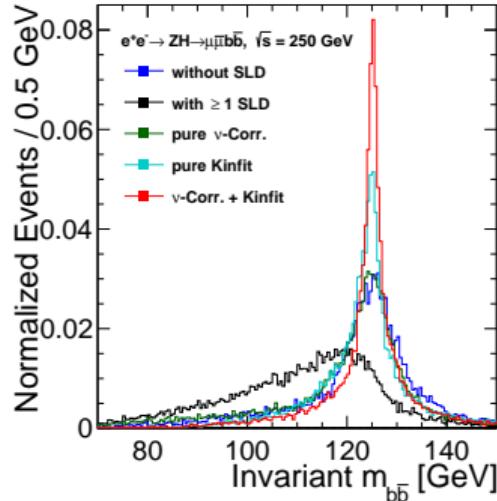


# Higgs mass reconstruction with kinematic fit in presence of SLDs

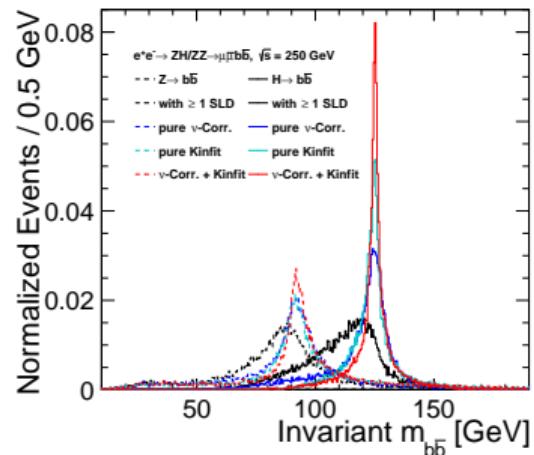


- ▶  $\nu$ -correction alone (pre-fit  $\vec{p}_\nu$ ) recovers Higgs mass
- ▶ striking improvement from new jet error parametrisation fed to kinematic fit even without  $\nu$ -correction
- ▶ significant further improvement by combined kinematic fit and  $\nu$ -correction (fully cheated), especially for the Higgs peak
- ▶ less powerful  $\nu$ -correction  $\Rightarrow$  performance is expected between Cyan and Red

# Higgs mass reconstruction with kinematic fit in presence of SLDs



- $\nu$ -correction alone (pre-fit  $\vec{p}_\nu$ ) recovers Higgs mass
- striking improvement from new jet error parametrisation fed to kinematic fit even without  $\nu$ -correction
- significant further improvement by combined kinematic fit and  $\nu$ -correction (fully cheated), especially for the Higgs peak
- less powerful  $\nu$ -correction  $\Rightarrow$  performance is expected between Cyan and Red



- $Z \rightarrow b\bar{b}/H \rightarrow b\bar{b}$  well separated by combined kinematic fit and  $\nu$ -correction (fully cheated)
- potentially large improvement eg for Higgs self-coupling prospects



## Conclusions

- ▶ Heavy flavour jets are essential for Higgs physics
- ▶ Correction of semi-leptonic decays of heavy flavour jets is important for Higgs mass reconstruction
- ▶ Kinematic fit exploits well-known initial state in  $e^+e^-$  colliders and requires excellent understanding of jet measurement
- ▶ High granular Particle Flow detectors provide full detail for estimating jet measurement uncertainties



# Remembering and honoring Mahsa Amini

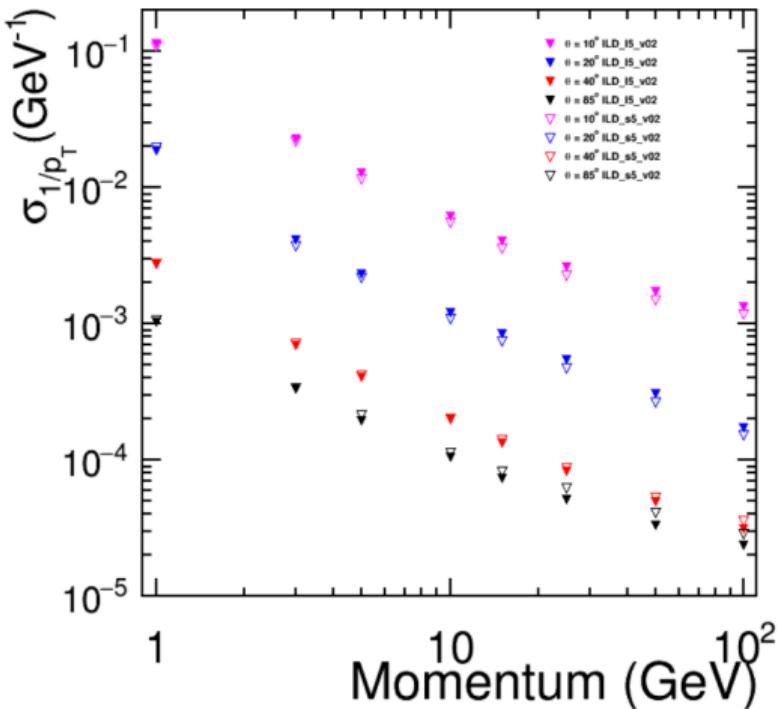


22 years old Iranian woman, arrested by morality police, fell into a coma and died in hospital due to police brutality. Crime? not wearing the hijab in accordance with government standards!

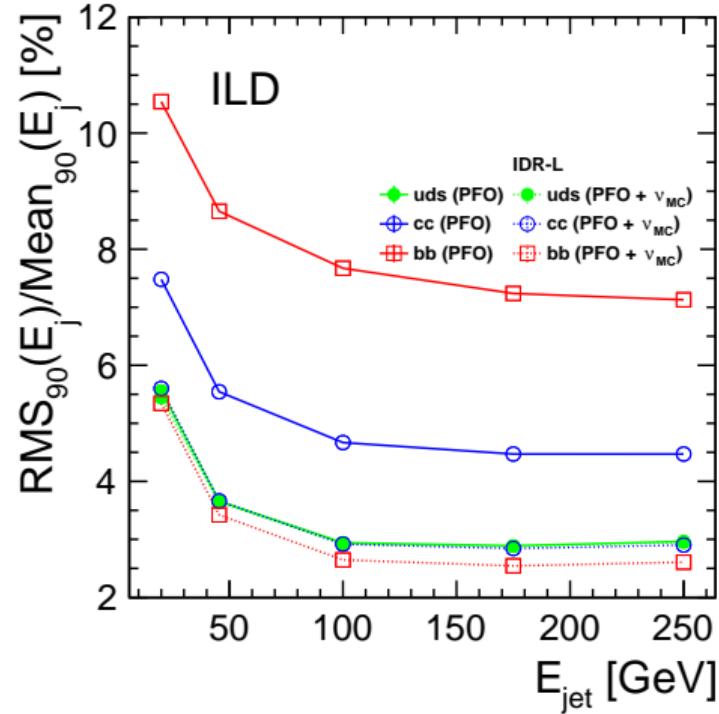
# BACKUP



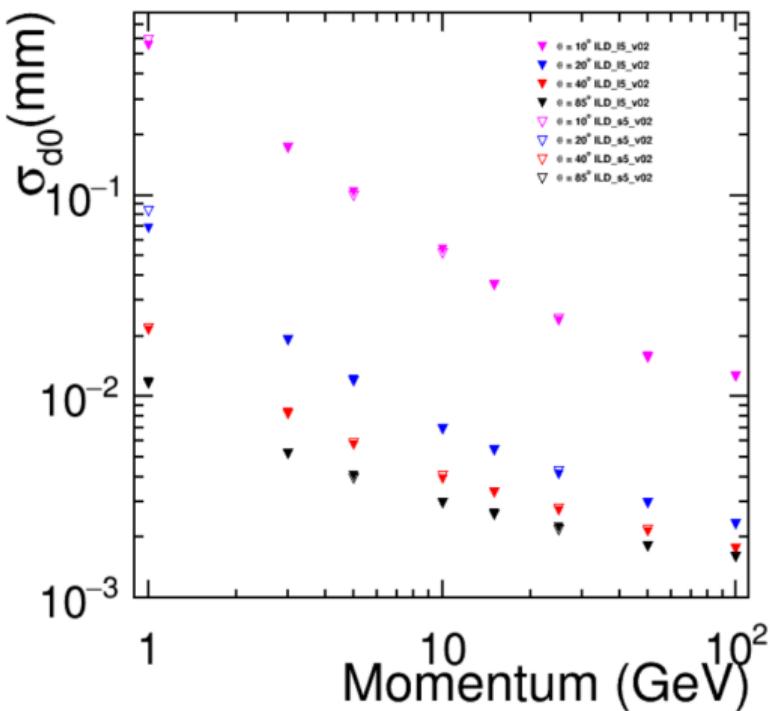
► Momentum Resolution



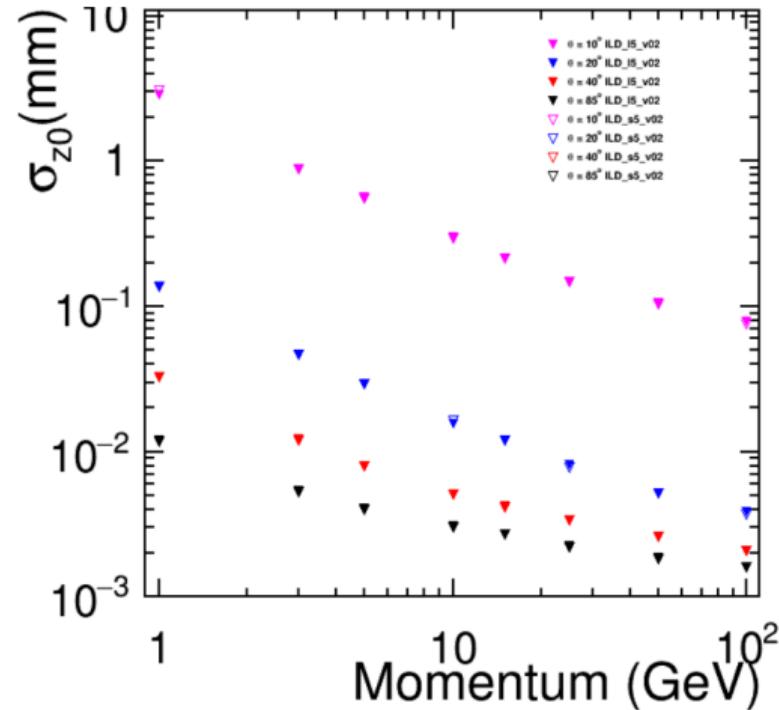
► Jet Energy Resolution ( $E_{PFO} + E_\nu^{MC}$ )



► Impact Parameter Resolution,  $d_0$



► Impact Parameter Resolution,  $z_0$

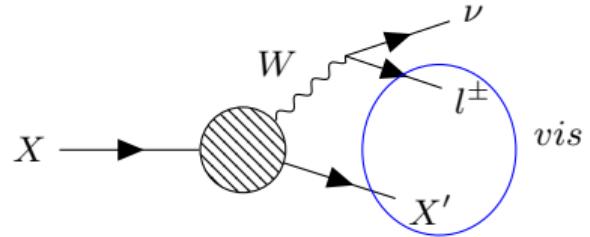


# Concept of $\nu$ -correction in a semi-leptonic decay

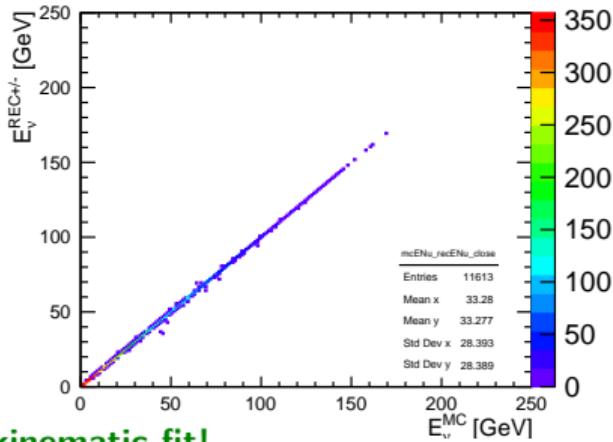
- ▶ Find heavy-quark jets: Identify  $b$  or  $c$  jet  $\rightarrow$  flavour tag
- ▶ Find semi-leptonic decay(s): Identify lepton in jet if present  $\rightarrow$  possible using detector's high granularity
- ▶ Estimate neutrino energy from decay kinematics:
  - ▶ Assign  $B^0$  or  $D^0$  meson mass to mother hadron.
  - ▶ Reconstruct flight direction of mother hadron from position of primary and secondary vertex.
  - ▶ Calculate neutrino momentum: up to 3-fold ambiguity.
- ▶ As proof-of-principle: CHEAT from MC truth
  - ▶ Lepton ID
  - ▶ Flavour tag
  - ▶ Mother hadron mass
  - ▶ **Associate of reconstructed particles to secondary vertex**
  - ▶ Momenta of visible decay products

The neutrino momentum can be determined up to a two-fold ambiguity

Can we use overall event kinematics to decide between solutions?  $\Rightarrow$  **kinematic fit!**



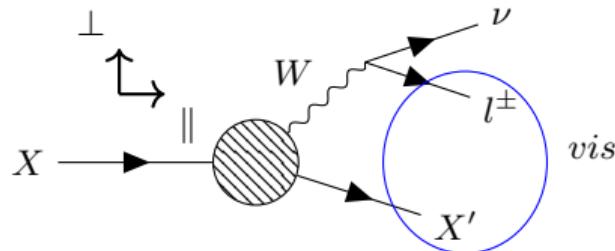
- ▶ Closure test: fully cheated information ( $e^+e^- \rightarrow b\bar{b}$  at  $\sqrt{s} = 500$  GeV)



# correcting neutrino energy

4-vector based approach

►  $(E, \vec{p})$ -based approach



$$\vec{p}_{\nu, \perp} = -\vec{p}_{vis, \perp}$$

$$\vec{p}_\nu, \parallel = \frac{1}{2D}(-A \pm \sqrt{A^2 - BD})\hat{n}$$

$$A = p_{vis, \parallel}(2p_{vis, \perp}^2 + m_{vis}^2 - m_X^2)$$

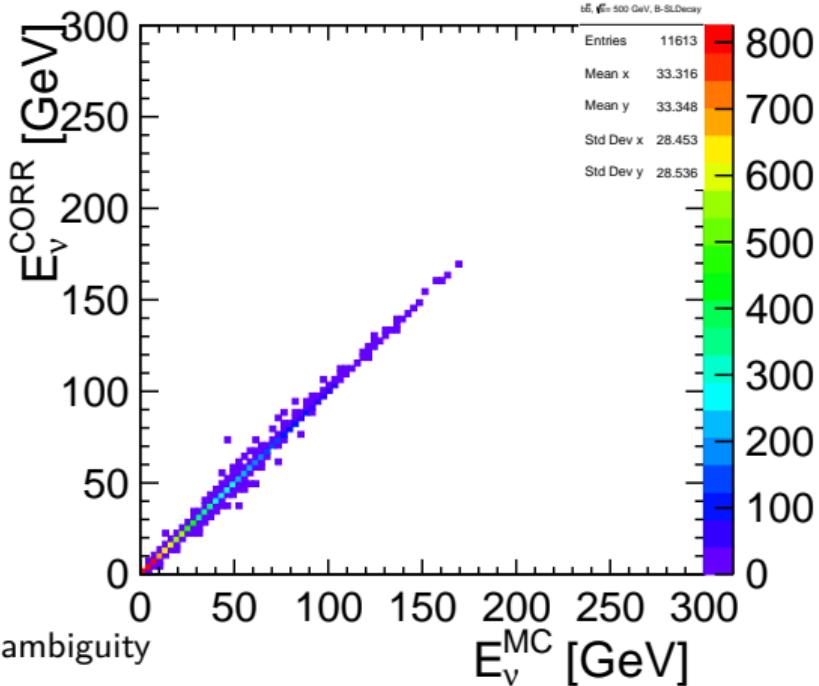
$$B = 4p_{vis, \perp}^2 E_{vis}^2 - (2p_{vis, \perp}^2 + m_{vis}^2 - m_X^2)^2$$

$$D = E_{vis}^2 - p_{vis, \parallel}^2$$

$$\hat{n} = \frac{\vec{p}_{vis, \parallel}}{|\vec{p}_{vis, \parallel}|}$$

The neutrino momentum can be determined up to a two-fold ambiguity

► closure test: apply correction with fully cheated information and compare with true neutrino energy

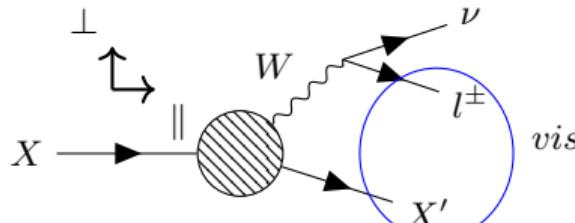


# Correcting neutrino energy

## Rapidity based approach

Rapidity under Lorentz-transformations  $\sim$  velocity under Galileo-transformations:  $\omega = \omega_X + \omega'$ ;  $\omega = \frac{1}{2} \ln \frac{E+p'_\parallel}{E-p'_\parallel}$

$\omega$ : rapidity in lab frame ,  $\omega'$ : rapidity in rest frame of  $X$  ,  $\omega_X$ : rapidity of  $X$  in lab frame



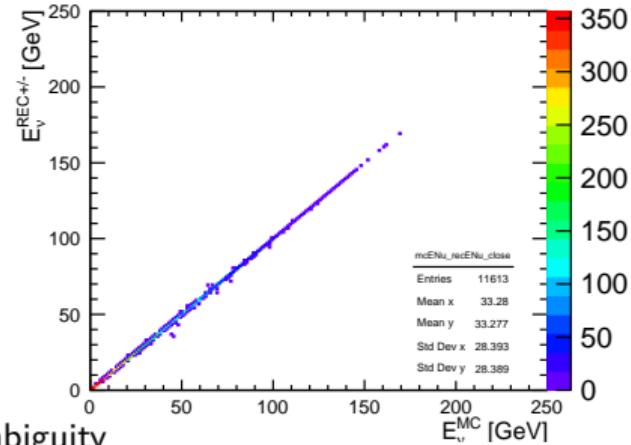
$$E_\nu = E_X - E_{vis}$$

$$E_X = \frac{E_{vis} E'_{vis} - p_{vis\parallel} p'_{vis\parallel}}{m_{vis}^2 + p_{vis\perp}^2} m_X$$

$$E'_{vis} = \frac{m_X^2 + m_{vis}^2}{2m_X}$$

$$p'_{vis\parallel} = \pm \sqrt{\left(\frac{m_X^2 - m_{vis}^2}{2m_X}\right)^2 - p_{vis\perp}^2}$$

► Closure test: fully cheated information  
 $(e^+e^- \rightarrow b\bar{b}$  at  $\sqrt{s} = 500$  GeV)



The neutrino momentum can be determined up to a two-fold ambiguity

Can we use overall event kinematics to decide between solutions?  $\Rightarrow$  kinematic fit!



## Pandora treatment with Neutral Hadrons

What Pandora does:

- ▶ Cluster energy is assigned to PFO(massless) energy;  $E_{\text{PFO}} = |\vec{p}_{\text{PFO}}| = E_{\text{clu}}$
- ▶ Neutral Hadrons are identified as neutron  $\Rightarrow m_n$  is set for PFO  $\Rightarrow$  **inconsistent 4-momentum!**
- ▶ CovMat of Neutral PFO is calculated (using inconsistent 4-momentum):  $C(\vec{p}, E) = J^T C(\vec{x}_{\text{clu}}, E_{\text{clu}}) J$

$$J = \begin{pmatrix} \frac{\partial p_x}{\partial x_c} & \frac{\partial p_y}{\partial x_c} & \frac{\partial p_z}{\partial x_c} & \frac{\partial E}{\partial x_c} \\ \frac{\partial p_x}{\partial p_y} & \frac{\partial p_z}{\partial p_y} & \frac{\partial p_z}{\partial p_y} & \frac{\partial E}{\partial p_y} \\ \frac{\partial y_c}{\partial y_c} & \frac{\partial y_c}{\partial p_y} & \frac{\partial y_c}{\partial p_z} & \frac{\partial y_c}{\partial E} \\ \frac{\partial p_x}{\partial z_c} & \frac{\partial p_y}{\partial z_c} & \frac{\partial p_z}{\partial z_c} & \frac{\partial E}{\partial z_c} \\ \frac{\partial p_x}{\partial E_c} & \frac{\partial p_y}{\partial E_c} & \frac{\partial p_z}{\partial E_c} & \frac{\partial E}{\partial E_c} \end{pmatrix}$$

Suggestion: Take consistent 4-momentum of massive neutral hadrons for CovMat calculations. CovMat( $\vec{p}, E$ ) of Neutral PFOs depend on the mass assumption.



## CovMat of Neutral PFOs

- ▶ Current CovMat calculation (MarlinReco/Analysis/AddClusterProperties)

$$E_{PFO} = |\vec{p}_{PFO}| = E_{clu}, p_x = E_{clu} \frac{x}{r}, p_y = E_{clu} \frac{y}{r}, p_z = E_{clu} \frac{z}{r}$$

- ▶ Alternative CovMat calculation (taking consistent 4-momentum of neutral hadrons)

$$E_{PFO} = \sqrt{|\vec{p}_{PFO}|^2 + m_{PFO}^2} = \sqrt{E_{clu}^2 + m_n^2}$$

$$J = \begin{pmatrix} E_{clu} \frac{r^2 - x^2}{r^3} & -E_{clu} \frac{xy}{r^3} & -E_{clu} \frac{xz}{r^3} & 0 \\ -E_{clu} \frac{xy}{r^3} & E_{clu} \frac{r^2 - y^2}{r^3} & -E_{clu} \frac{yz}{r^3} & 0 \\ -E_{clu} \frac{xz}{r^3} & -E_{clu} \frac{yz}{r^3} & E_{clu} \frac{r^2 - z^2}{r^3} & 0 \\ \frac{x}{r} & \frac{y}{r} & \frac{z}{r} & 1 \end{pmatrix} \rightarrow J = \begin{pmatrix} E_{clu} \frac{r^2 - x^2}{r^3} & -E_{clu} \frac{xy}{r^3} & -E_{clu} \frac{xz}{r^3} & 0 \\ -E_{clu} \frac{xy}{r^3} & E_{clu} \frac{r^2 - y^2}{r^3} & -E_{clu} \frac{yz}{r^3} & 0 \\ -E_{clu} \frac{xz}{r^3} & -E_{clu} \frac{yz}{r^3} & E_{clu} \frac{r^2 - z^2}{r^3} & 0 \\ \frac{E}{E_{clu}} \cdot \frac{x}{r} & \frac{E}{E_{clu}} \cdot \frac{y}{r} & \frac{E}{E_{clu}} \cdot \frac{z}{r} & 1 \end{pmatrix}$$

using error propagation, PFO angular uncertainties are calculated directly from cluster position error:

$$\sigma_\theta^2 = \left(\frac{\partial\theta}{\partial x}\right)^2 \sigma_x^2 + \left(\frac{\partial\theta}{\partial y}\right)^2 \sigma_y^2 + \left(\frac{\partial\theta}{\partial z}\right)^2 \sigma_z^2 + \frac{\partial\theta}{\partial x} \frac{\partial\theta}{\partial y} \sigma_{xy} + \frac{\partial\theta}{\partial x} \frac{\partial\theta}{\partial z} \sigma_{xz} + \frac{\partial\theta}{\partial y} \frac{\partial\theta}{\partial z} \sigma_{yz}$$

$$\sigma_\phi^2 = \left(\frac{\partial\phi}{\partial x}\right)^2 \sigma_x^2 + \left(\frac{\partial\phi}{\partial y}\right)^2 \sigma_y^2 + \frac{\partial\phi}{\partial x} \frac{\partial\phi}{\partial y} \sigma_{xy}$$

MUST: angular and energy uncertainties remain unchanged!



# Event selection

Select  $e^+e^- \rightarrow ZH \rightarrow \mu\bar{\mu} b\bar{b}$  events at  $\sqrt{s} = 250$  GeV with (exactly) 2-leptons + 2-jets final state:

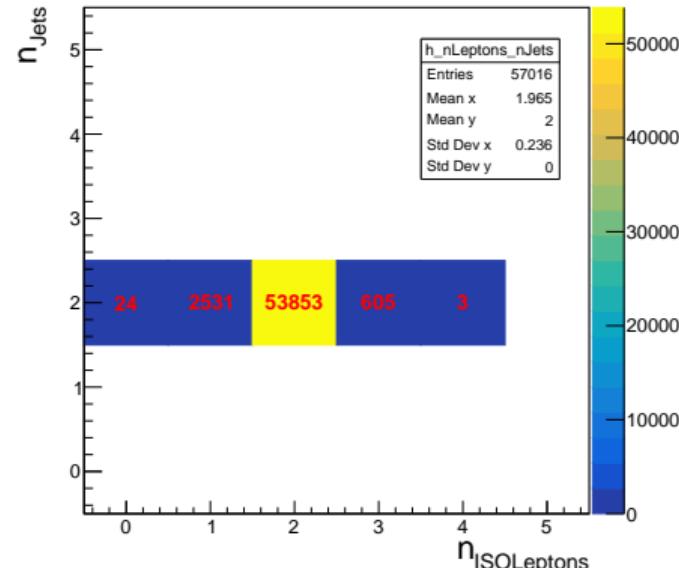
## ► IsolatedLeptonTagging

Training for the IDR 500 GeV samples is used,

1. Lepton ID:  $\mu^\pm$   
Deposited energy in subdetectors
2. Vertex: primary or secondary  
Significance of impact parameters ( $d_0$ ,  $z_0$ )
3. Isolated: not belong to jets

## ► FastJetProcessor

- ▶ Exclusive  $k_t$  (Durham) algorithm (no overlay)
- ▶ Find smallest of  $(d_{ij}, d_{iB})$   
$$d_{ij} = 2 \min(E_i^2, E_j^2)(1 - \cos \theta_{ij})$$
 $i, j: \text{particles, } B: \text{Beam}$
- ▶  $d_{ij} < d_{iB}$ : combine  $i \& j$  as pseudojet( $p$ ):  $p_i + p_j$
- ▶  $d_{iB} < d_{ij}$ : remove particle  $i$  from list
- ▶ Repeat iteration until  $d_{ij}$  or  $d_{iB} > d_{cut}$  (threshold)

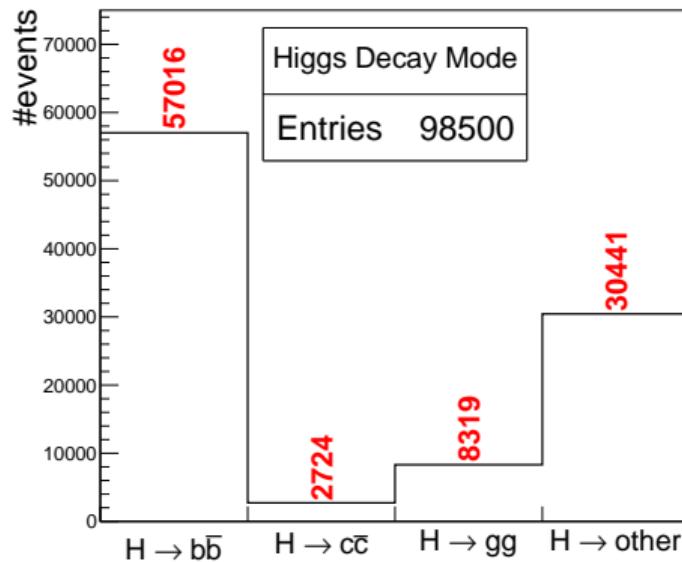


IsolatedLeptonTagging has not been trained for new software at 250 GeV yet!



## event selection

separate Higgs decay modes:  $H \rightarrow b\bar{b}$ , cheat from MCTruth



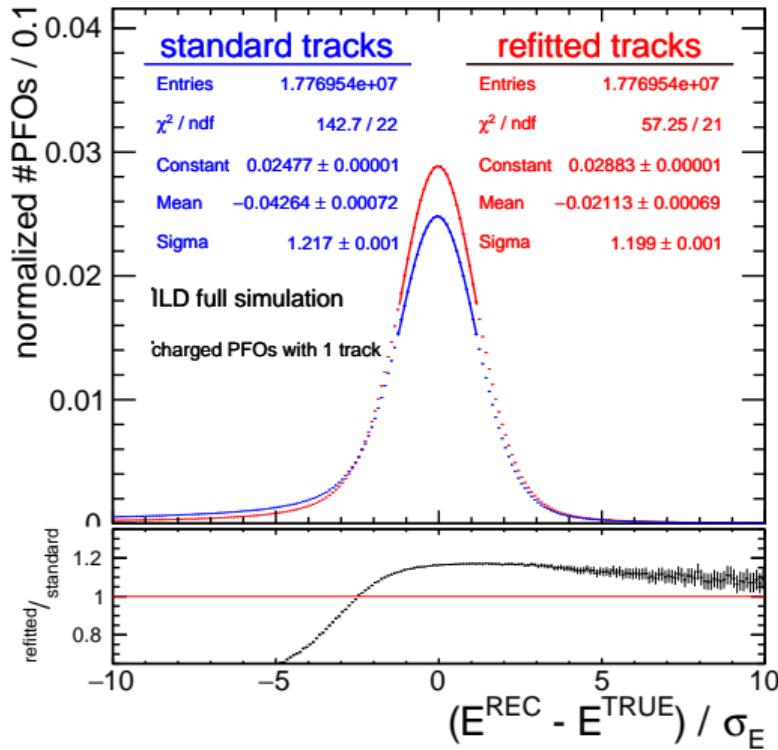
$\frac{2}{3}$  of  $b\bar{b}$  jets contain at-least one semi-leptonic decay  $\Rightarrow$  Frequent  $H \rightarrow b\bar{b}$  needs neutrino correction.



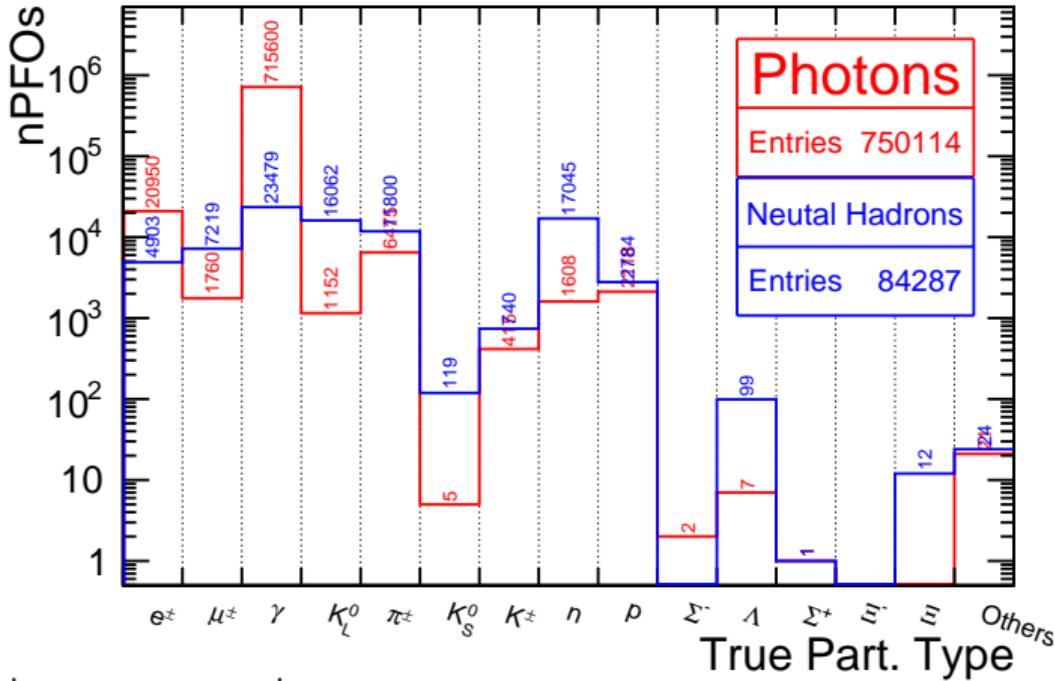
# PFO-level detector resolution, $\sigma_{\text{Det}}$ for charged PFOs

## Energy

- ▶ Standard tracks: all tracks fitted with  $m_{\pi^\pm}$  in standard reconstruction of charged PFOs.
- ▶ refitting tracks:
  - ▶ refit  $K^\pm$  and  $p^\pm$  tracks with true mass of particle
  - ▶ calculated  $E_{\text{PFO}}$  from momentum using true mass cheated particle ID, FTB
- ▶ See talk by B. Duder
- ▶ slight improvement on energy uncertainty by track refitting with true mass  
narrower distribution
- ▶ further improvement by calculating energy from momentum using true mass for  $K^\pm$  and  $p^\pm$   
migrating PFOs to core of distribution



# Neutral PFO identification by Pandora



Majority of identified photons are true photons.

No explicit decision for mass of identified neutral hadrons due to their multiplicity.



# Pandora treatment with Neutral Hadrons

What Pandora does:

- ▶ Cluster energy is assigned to PFO(massless) energy  
 $E_{PFO} = |\vec{p}_{PFO}| = E_{cluster}$
- ▶ Neutral Hadrons are identified as neutron
- ▶ neutron mass is set for PFO  $\Rightarrow$  **inconsistent 4-momentum!**
- ▶ CovMat of Neutral PFO is calculated (using inconsistent 4-momentum):  
 $\text{CovMat}(\vec{p}, E) = J^T \text{CovMat}(\vec{x}_{clu}, E_{clu}) J$

$$J = \begin{pmatrix} \frac{\partial p_x}{\partial x_c} & \frac{\partial p_y}{\partial x_c} & \frac{\partial p_z}{\partial x_c} & \frac{\partial E}{\partial x_c} \\ \frac{\partial p_x}{\partial p_y} & \frac{\partial p_y}{\partial p_y} & \frac{\partial p_z}{\partial p_z} & \frac{\partial E}{\partial E} \\ \frac{\partial y_c}{\partial y_c} & \frac{\partial y_c}{\partial p_y} & \frac{\partial y_c}{\partial p_z} & \frac{\partial z_c}{\partial y_c} \\ \frac{\partial p_x}{\partial z_c} & \frac{\partial z_c}{\partial p_y} & \frac{\partial z_c}{\partial p_z} & \frac{\partial z_c}{\partial E} \\ \frac{\partial p_x}{\partial E_c} & \frac{\partial p_y}{\partial E_c} & \frac{\partial p_z}{\partial E_c} & \frac{\partial E}{\partial E_c} \end{pmatrix}$$

$\text{CovMat}(\vec{p}, E)$  of Neutral PFOs depend on the mass assumption.

Suggestion: Take consistent 4-momentum of massive neutral hadrons for CovMat calculations.



## CovMat of Neutral PFOs

- ▶ Current CovMat calculation (MarlinReco/Analysis/AddClusterProperties)

$$E_{PFO} = |\vec{p}_{PFO}| = E_{clu}, p_x = E_{clu} \frac{x}{r}, p_y = E_{clu} \frac{y}{r}, p_z = E_{clu} \frac{z}{r}$$

- ▶ Alternative CovMat calculation (taking consistent 4-momentum of neutral hadrons)

$$E_{PFO} = \sqrt{|\vec{p}_{PFO}|^2 + m_{PFO}^2} = \sqrt{E_{clu}^2 + m_n^2}$$

$$J = \begin{pmatrix} E_{clu} \frac{r^2 - x^2}{r^3} & -E_{clu} \frac{xy}{r^3} & -E_{clu} \frac{xz}{r^3} & 0 \\ -E_{clu} \frac{xy}{r^3} & E_{clu} \frac{r^2 - y^2}{r^3} & -E_{clu} \frac{yz}{r^3} & 0 \\ -E_{clu} \frac{xz}{r^3} & -E_{clu} \frac{yz}{r^3} & E_{clu} \frac{r^2 - z^2}{r^3} & 0 \\ \frac{x}{r} & \frac{y}{r} & \frac{z}{r} & 1 \end{pmatrix} \rightarrow J = \begin{pmatrix} E_{clu} \frac{r^2 - x^2}{r^3} & -E_{clu} \frac{xy}{r^3} & -E_{clu} \frac{xz}{r^3} & 0 \\ -E_{clu} \frac{xy}{r^3} & E_{clu} \frac{r^2 - y^2}{r^3} & -E_{clu} \frac{yz}{r^3} & 0 \\ -E_{clu} \frac{xz}{r^3} & -E_{clu} \frac{yz}{r^3} & E_{clu} \frac{r^2 - z^2}{r^3} & 0 \\ \frac{E}{E_{clu}} \cdot \frac{x}{r} & \frac{E}{E_{clu}} \cdot \frac{y}{r} & \frac{E}{E_{clu}} \cdot \frac{z}{r} & 1 \end{pmatrix}$$

using error propagation, PFO angular uncertainties are calculated directly from cluster position error:

$$\sigma_\theta^2 = \left(\frac{\partial\theta}{\partial x}\right)^2 \sigma_x^2 + \left(\frac{\partial\theta}{\partial y}\right)^2 \sigma_y^2 + \left(\frac{\partial\theta}{\partial z}\right)^2 \sigma_z^2 + \frac{\partial\theta}{\partial x} \frac{\partial\theta}{\partial y} \sigma_{xy} + \frac{\partial\theta}{\partial x} \frac{\partial\theta}{\partial z} \sigma_{xz} + \frac{\partial\theta}{\partial y} \frac{\partial\theta}{\partial z} \sigma_{yz}$$

$$\sigma_\phi^2 = \left(\frac{\partial\phi}{\partial x}\right)^2 \sigma_x^2 + \left(\frac{\partial\phi}{\partial y}\right)^2 \sigma_y^2 + \frac{\partial\phi}{\partial x} \frac{\partial\phi}{\partial y} \sigma_{xy}$$

MUST: angular and energy uncertainties remain unchanged!



# CovMat of Jets

► AddClusterProperties/FourMomentumCovMat:  $\text{CovMat}(\text{cluster}/\text{track}) \rightarrow \text{CovMat}(\vec{p}, E)$

► Current CovMat calculation (inconsistent 4-momentum of neutral hadrons):

$$E_{PFO} = |\vec{p}_{PFO}| = E_{clu}, p_x = E_{clu} \frac{x}{r}, p_y = E_{clu} \frac{y}{r}, p_z = E_{clu} \frac{z}{r}, m_{PFO} = m_n$$

► Alternative CovMat calculation (taking consistent 4-momentum of neutral hadrons)

$$E_{PFO} = \sqrt{|\vec{p}_{PFO}|^2 + m_{PFO}^2} = \sqrt{E_{clu}^2 + m_n^2}$$

*J<sub>(wrong)</sub> → J<sub>(right)</sub>*

$$\begin{pmatrix} E_{clu} \frac{r^2-x^2}{r^3} & -E_{clu} \frac{xy}{r^3} & -E_{clu} \frac{xz}{r^3} & 0 \\ -E_{clu} \frac{xy}{r^3} & E_{clu} \frac{r^2-y^2}{r^3} & -E_{clu} \frac{yz}{r^3} & 0 \\ -E_{clu} \frac{xz}{r^3} & -E_{clu} \frac{yz}{r^3} & E_{clu} \frac{r^2-z^2}{r^3} & 0 \\ \frac{x}{r} & \frac{y}{r} & \frac{z}{r} & 1 \end{pmatrix}_{\text{wrong}} \rightarrow \begin{pmatrix} E_{clu} \frac{r^2-x^2}{r^3} & -E_{clu} \frac{xy}{r^3} & -E_{clu} \frac{xz}{r^3} & 0 \\ -E_{clu} \frac{xy}{r^3} & E_{clu} \frac{r^2-y^2}{r^3} & -E_{clu} \frac{yz}{r^3} & 0 \\ -E_{clu} \frac{xz}{r^3} & -E_{clu} \frac{yz}{r^3} & E_{clu} \frac{r^2-z^2}{r^3} & 0 \\ \frac{E}{E_{clu}} \cdot \frac{x}{r} & \frac{E}{E_{clu}} \cdot \frac{y}{r} & \frac{E}{E_{clu}} \cdot \frac{z}{r} & 1 \end{pmatrix}_{\text{right}}$$

► ErrorFlow:

$$\text{CovMat}(\vec{p}_{jet}, E_{jet}) = \sum_{PFO} \text{CovMat}(\vec{p}, E) \quad : \quad \sigma_{E_{jet}}^2 = \sigma_{conf}^2 + \sum_{PFO} \sigma_{E_{PFO}}^2$$

► MarlinKinfitProcessors:

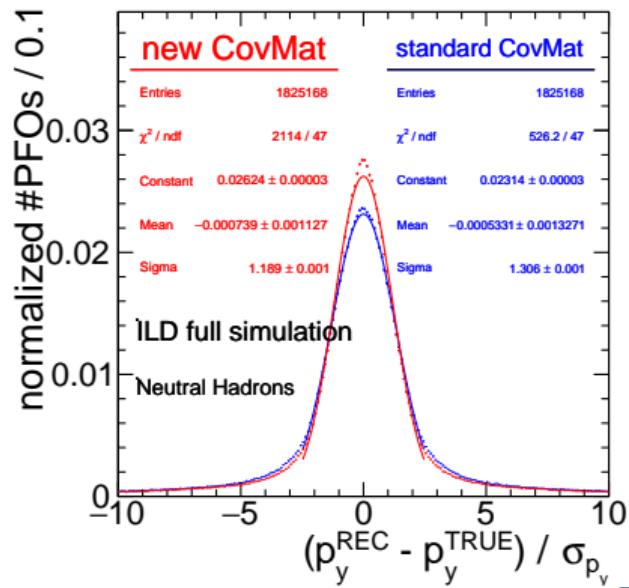
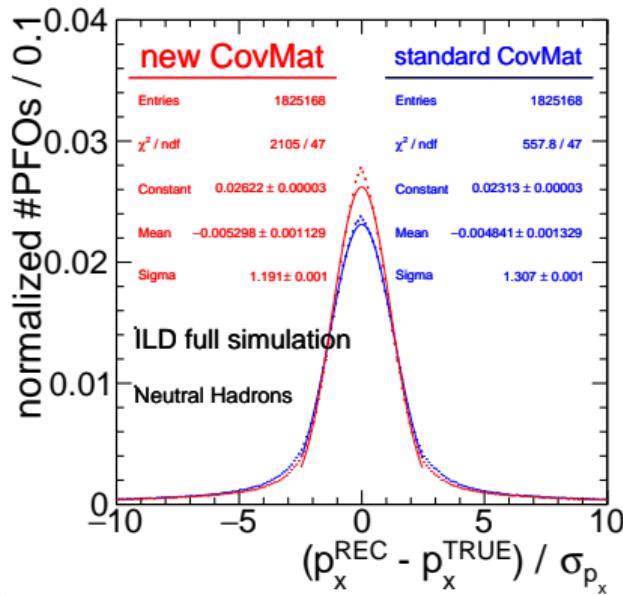
$$\text{CovMat}(\vec{p}_{jet}, E_{jet}) \rightarrow (\sigma_{\theta_{jet}}, \sigma_{\phi_{jet}}, \sigma_{E_{jet}})$$



# Pandora treatment with Neutral Hadrons

- Cluster energy is assigned to PFO(massless) energy;  $E_{\text{PFO}} = |\vec{p}_{\text{PFO}}| = E_{\text{clu}}$
- Neutral Hadrons are identified as neutron  $\Rightarrow m_n$  is set for PFO  $\Rightarrow$  **inconsistent 4-momentum!**
- CovMat of Neutral PFO is calculated (using inconsistent 4-momentum):  $C(\vec{p}, E) = J^T C(\vec{x}_{\text{clu}}, E_{\text{clu}}) J$

**Suggestion:** Take consistent 4-momentum of massive neutral hadrons for CovMat calculations.



# Covariance of measured quantities

$$\sigma_\phi^2 = \left(\frac{\partial\phi}{\partial p_x}\right)^2 \sigma_{p_x}^2 + \left(\frac{\partial\phi}{\partial p_y}\right)^2 \sigma_{p_y}^2 + 2 \frac{\partial\phi}{\partial p_x} \frac{\partial\phi}{\partial p_y} \sigma_{p_x p_y}$$

underestimated  $\sigma_{p_x}$  and  $\sigma_{p_y}$  by  $\sim 20\%$ , but  $\sigma_{p_x p_y}$ ?

$$\text{Var}\left(\frac{p_x^{\text{REC}} - p_x^{\text{TRUE}}}{\sigma_{p_x}} - \frac{p_y^{\text{REC}} - p_y^{\text{TRUE}}}{\sigma_{p_y}}\right) = \\ \text{Var}\left(\frac{p_x^{\text{REC}} - p_x^{\text{TRUE}}}{\sigma_{p_x}}\right) + \text{Var}\left(\frac{p_y^{\text{REC}} - p_y^{\text{TRUE}}}{\sigma_{p_y}}\right) \\ - 2\text{Cov}\left(\frac{p_x^{\text{REC}} - p_x^{\text{TRUE}}}{\sigma_{p_x}}, \frac{p_y^{\text{REC}} - p_y^{\text{TRUE}}}{\sigma_{p_y}}\right)$$

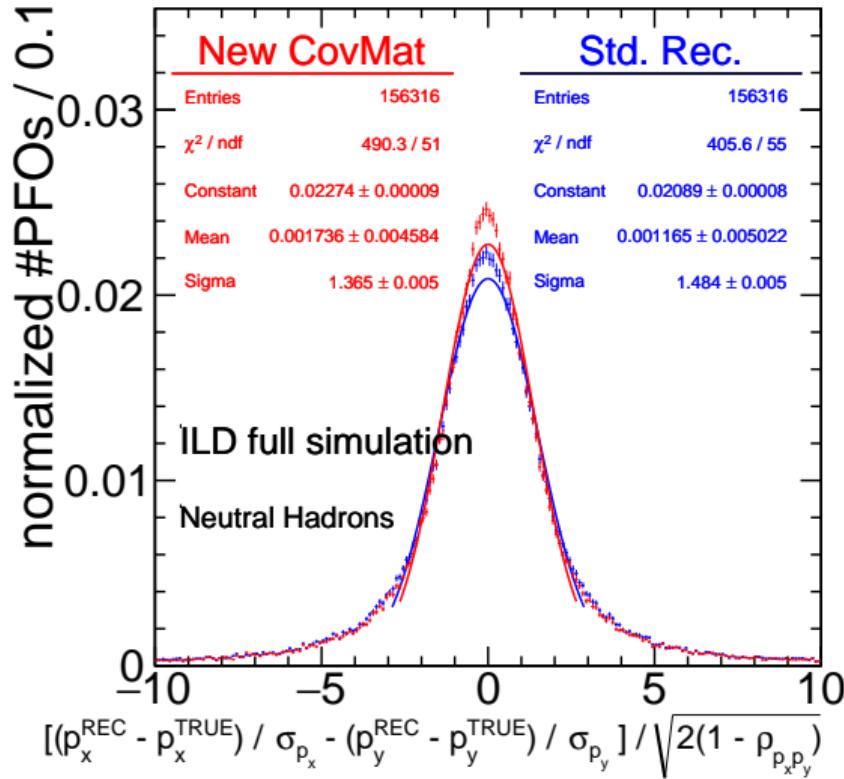
perfect Gaussian  $\frac{p_{x/y}^{\text{REC}} - p_{x/y}^{\text{TRUE}}}{\sigma_{p_{x/y}}} \Rightarrow \text{Mean} = 0, \text{Sigma} = 1$

$$\rho_{p_x p_y} = \text{Cor}(p_x, p_y) = \frac{\sigma_{p_x p_y}}{\sigma_{p_x} \sigma_{p_y}}$$

$$\text{Var}\left(\frac{p_x^{\text{REC}} - p_x^{\text{TRUE}}}{\sigma_{p_x}} - \frac{p_y^{\text{REC}} - p_y^{\text{TRUE}}}{\sigma_{p_y}}\right) = \\ 1 + 1 - 2 \frac{\sigma_{p_x p_y}}{\sigma_{p_x} \sigma_{p_y}} = 2(1 - \rho_{p_x p_y})$$

For evaluating off-diagonal elements:

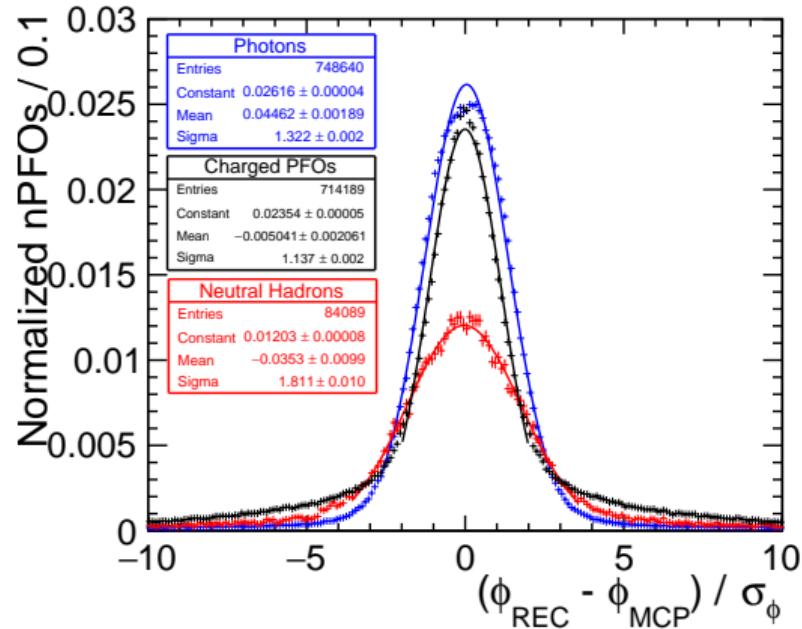
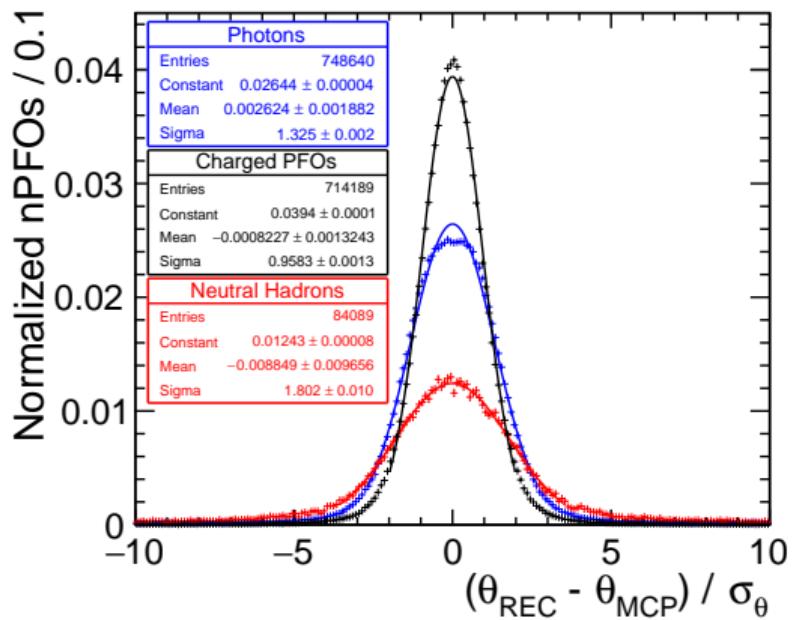
$$\frac{\frac{p_x^{\text{REC}} - p_x^{\text{TRUE}}}{\sigma_{p_x}} - \frac{p_y^{\text{REC}} - p_y^{\text{TRUE}}}{\sigma_{p_y}}}{\sqrt{2(1 - \rho_{p_x p_y})}}$$



# ErrorFlow: Jet Error Parametrisation from Particle Flow Objects (PFO)

## Angles

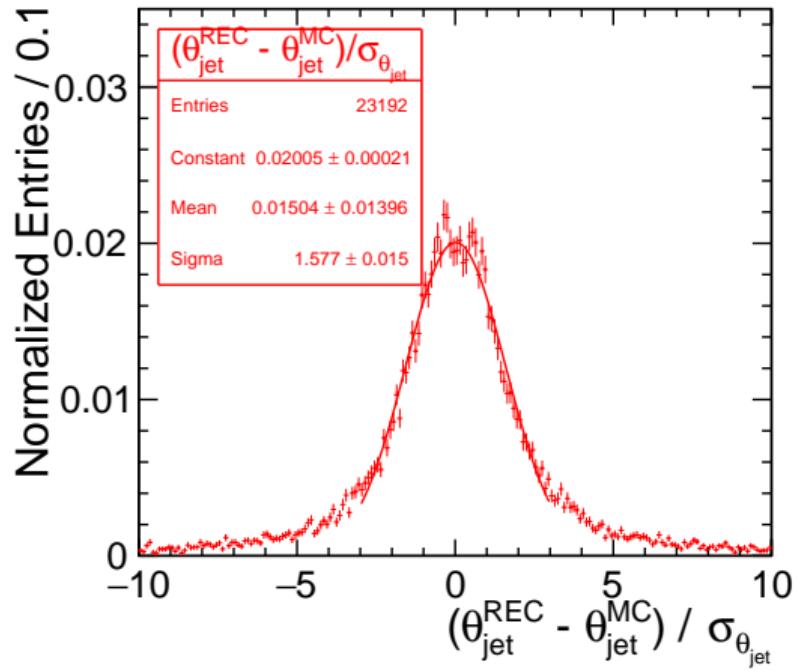
The angular uncertainties obtained directly from track parameters / cluster position errors



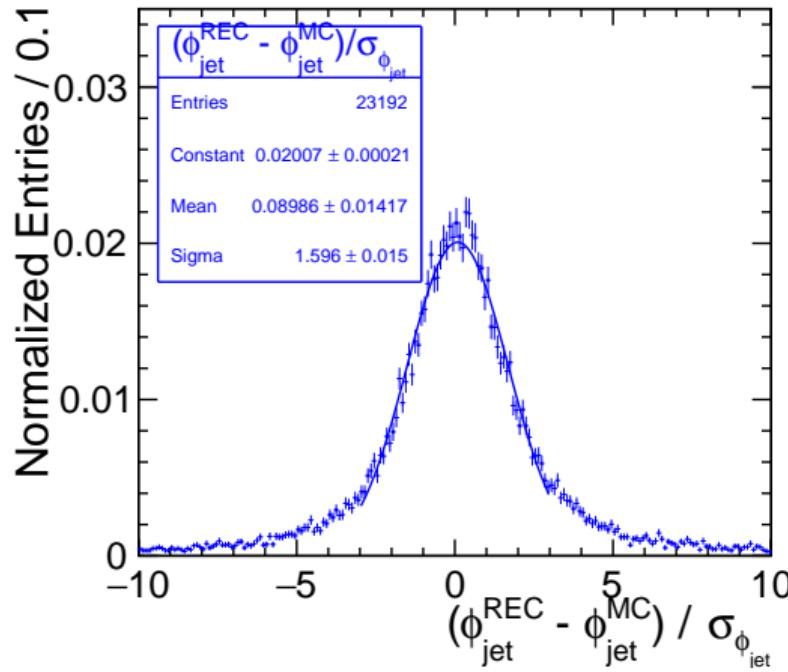
⇒ Scale  $\sigma_\theta$  and  $\sigma_\phi$  by factor  $\sim 1.3$  (for photons) and  $\sim 1.8$  (for neutral hadrons)



## Uncertainties in jet-level: $\theta$ & $\phi$



Jet angular uncertainties need scaling factor  $\sim 1.6$



## Neutrino correction hypothesis

- ▶ Assign semi-leptonic decays to jets
- ▶ Add neutrino momentum to 4-momentum of assigned jet:

Test three hypothesis for neutrino energy in each semi-leptonic decay:  $E_\nu^+$ ,  $E_\nu^-$ , 0

$3^{nSLD}$  combination of  $E_\nu$ 's for adding to jet 4-momentum:

Number of semileptonic decays in a jet:  $nSLD = nSLDB + nSLDC$

Example:

If an event contains two jets: jet-1 contains 2 semi-leptonic decays and jet-2 contains 1 semi-leptonic decay, **27**(= $3^2 \times 3^1$ ) combinations of  $E_\nu$ 's are available for neutrino correction in the event:

▶ jet-1:

comb.	1	2	3	4	5	6	7	8	9
$\vec{p}_{\nu,1}$	-	+	0	-	+	0	-	+	0
$\vec{p}_{\nu,2}$	-	-	-	+	+	+	0	0	0

▶ jet-2:

comb.	1	2	3
$\vec{p}_{\nu,3}$	-	+	0

$\vec{p}_{\nu,1} + \vec{p}_{\nu,2}$  is added to 4-momentum of jet-1 and  $\vec{p}_{\nu,3}$  is added to 4-momentum of jet-2.

$\vec{p}_{\nu,1} + \vec{p}_{\nu,2} + \vec{p}_{\nu,3} = 0$  allows fitter to neglect neutrino correction

Combination with highest fit probability is chosen as best neutrino correction.



# Simple neutrino correction for Higgs mass reconstruction

## ► Neutrino energy correction:

Estimating neutrino energy as a fraction of corresponding lepton energy:

$$E_{jet}^{corr} = E_{jet} + E_\nu = E_{jet} + \left(\frac{1}{x} - 1\right) E_{lep}$$

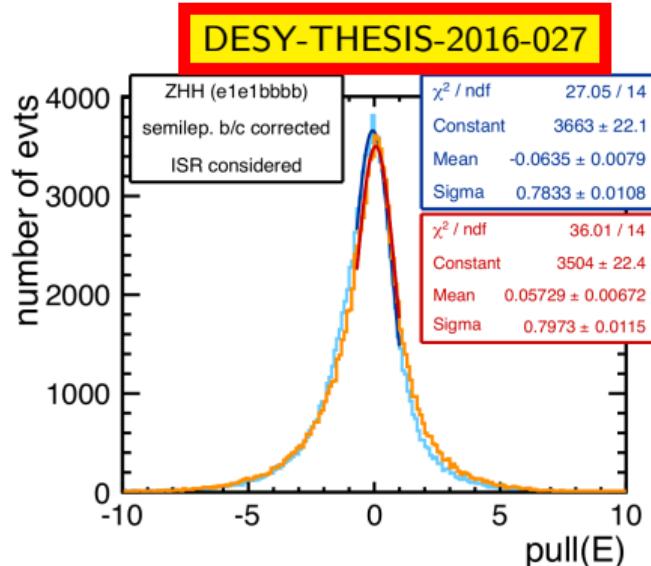
## ► Uncertainty on jet energy parametrised as:

$$\sigma_{E_{jet}}^{corr} = \frac{100\%}{\sqrt{E_{jet}}} \oplus \sigma_\nu$$

$$\sigma_\nu^2 = \left(\frac{\sigma_{\langle x \rangle}}{\langle x \rangle^2}\right)^2 E_{lep}^2 + \left(\frac{1}{x} - 1\right) \Delta E_{lep}^2$$

## ► Fixed uncertainties on angles:

$$\Delta\theta_{jet} = \Delta\phi_{jet} = 100 \text{ mrad}$$



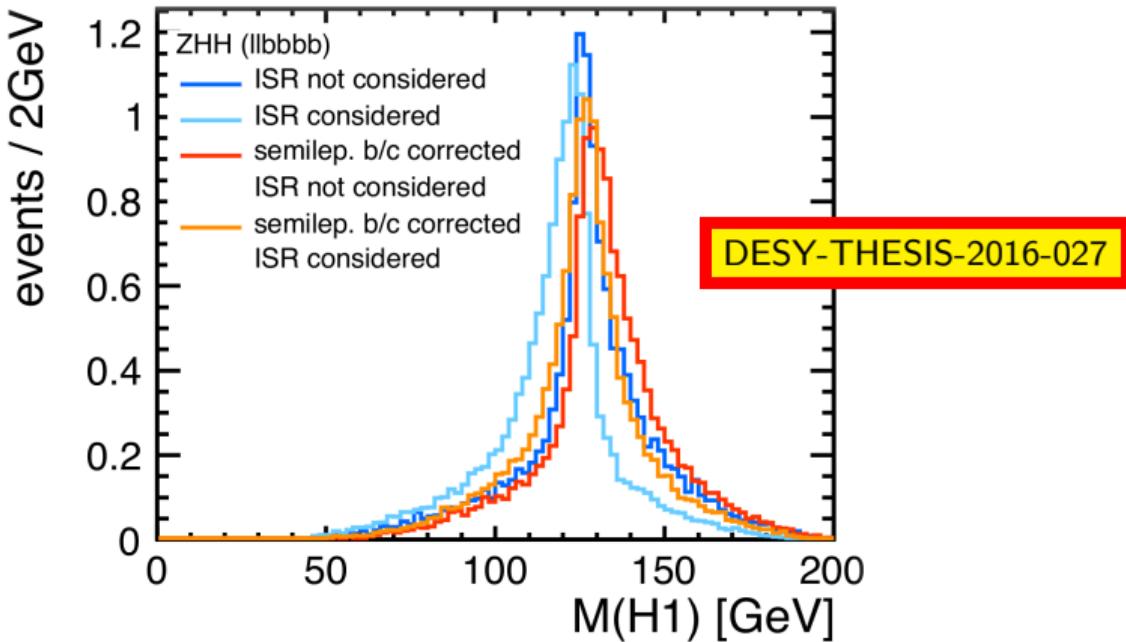
Blue: before neutrino energy correction

Orange: After neutrino energy correction

Simple correction to jet energy improves jet energy pull distribution as a measure of fit performance.



## Simple neutrino correction for Higgs mass reconstruction



- Bias and assymetry in  $m_H$  is removed by correcting jet energy and adding ISR



# Error flow and application in kinematic fit

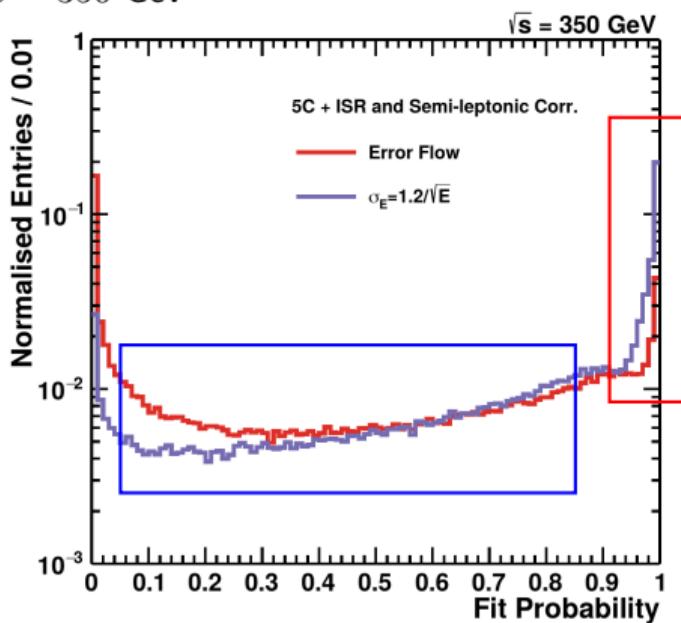
Jet specific energy resolution for  $e^+e^- \rightarrow ZH \rightarrow q\bar{q}b\bar{b}$  process at  $\sqrt{s} = 350$  GeV

DESY-THESIS-2017-045

- ▶ 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 error parametrization and handling sl-decays

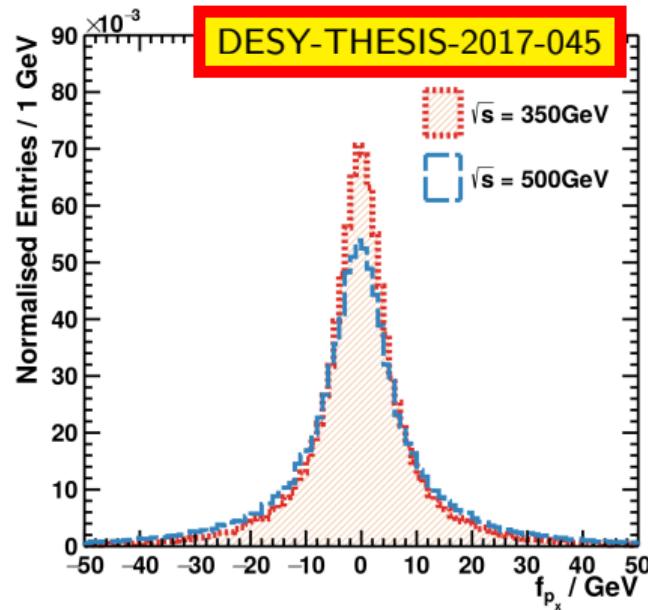


## fit constraints

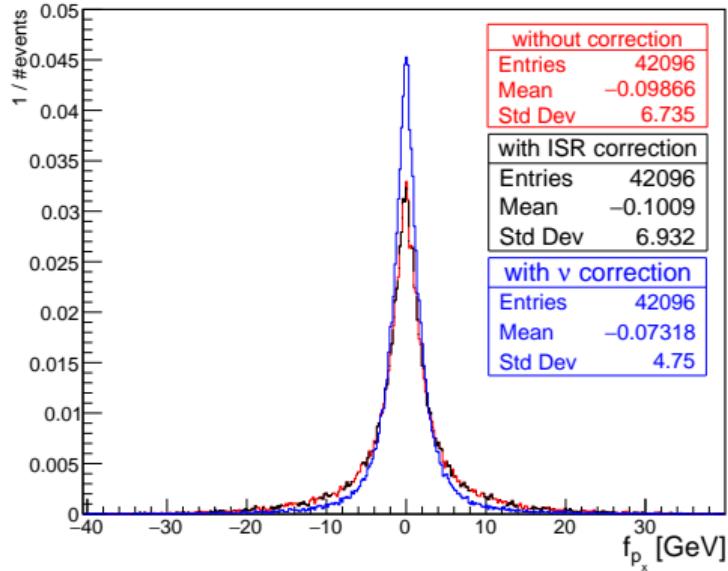
momentum conservation:  $p_x$

ISR is initialized to satisfy momentum conservation on  $x$  direction

- ▶ by error flow on jet energy



- ▶ by error flow on CovMatrix (new)



angular resolution for individual jets: improved constraint on momentum conservation

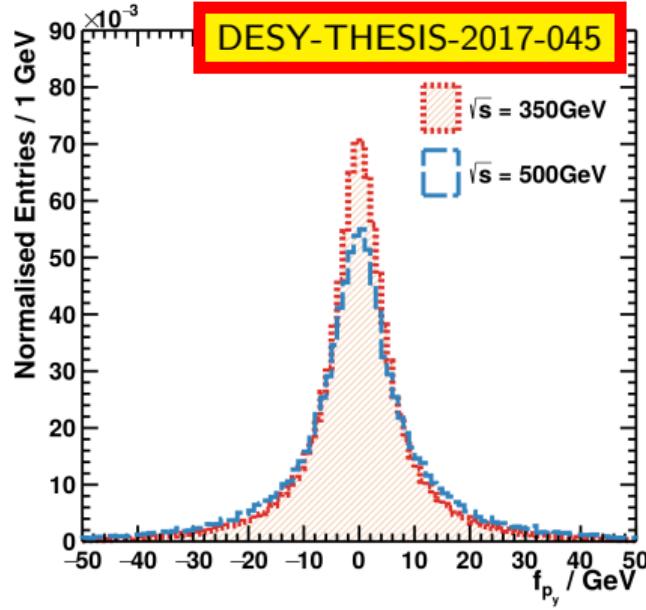


## fit constraints

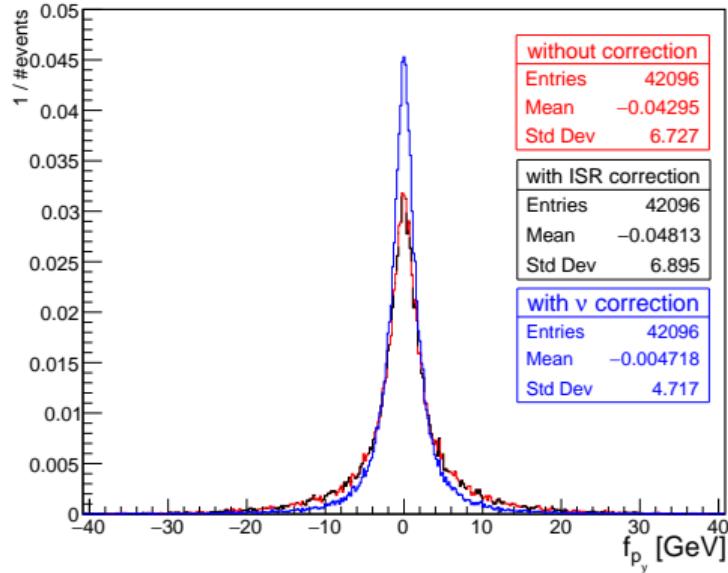
momentum conservation:  $p_y$

ISR is initialized to satisfy momentum conservation on  $z$  direction

- ▶ by error flow on jet energy



- ▶ by error flow on CovMatrix (new)



angular resolution for individual jets: improved constraint on momentum conservation

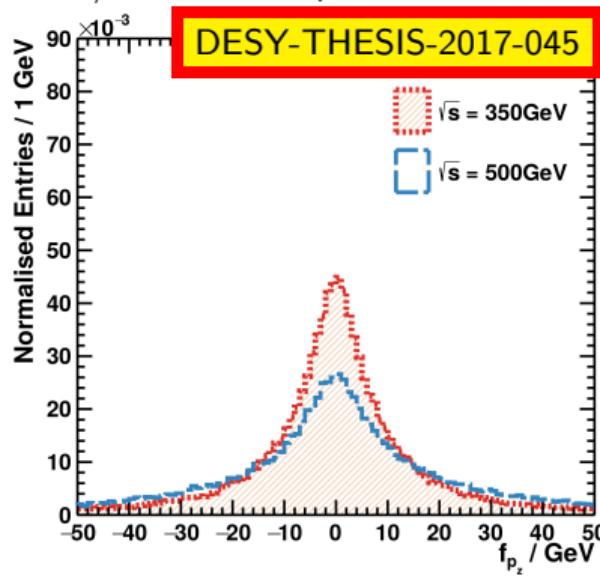


## Fit constraints

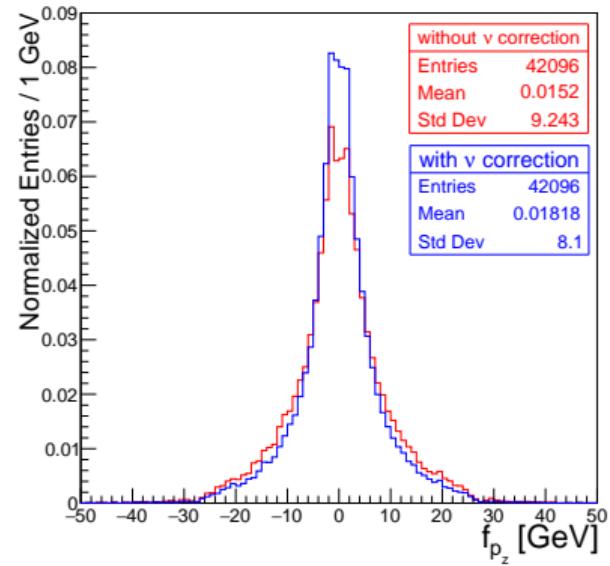
Momentum conservation:  $p_z$

Adding 4-momentum of neutrino improves jet fit object initialization

- DBD 350/500 GeV samples



- MC-2020 250 GeV prod. samples



Proper neutrino correction for jets: improved constraint on momentum

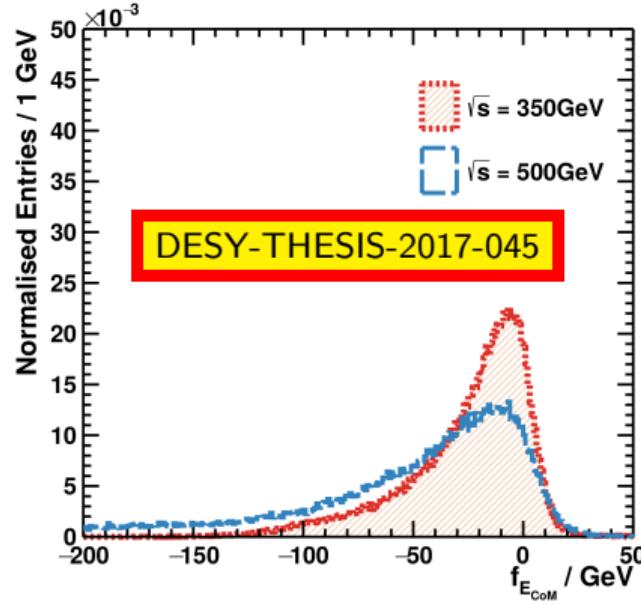


## fit constraints

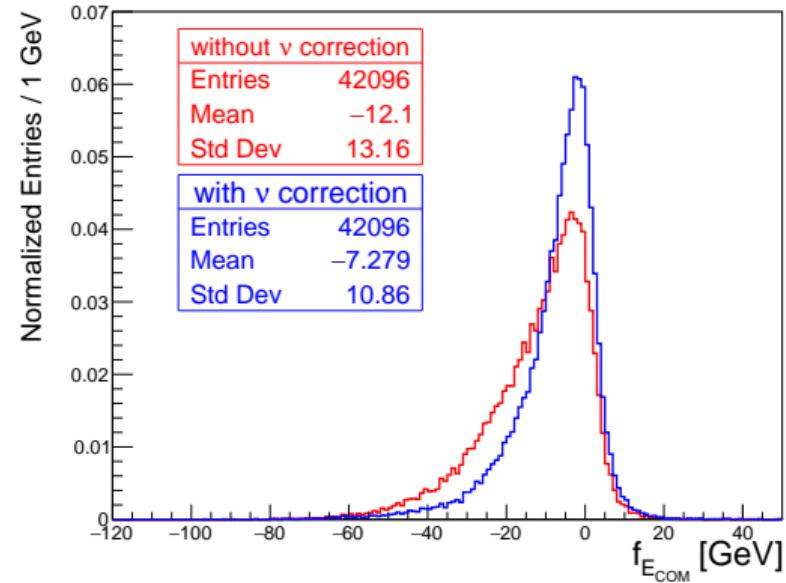
energy conservation:  $E$

Neutrino correction (best pre-fit  $\vec{p}_\nu$  for successful fits) improves start values  $\Rightarrow$  better fit object initialization

- DBD 350/500 GeV samples



- MC-2020 250 GeV prod. samples

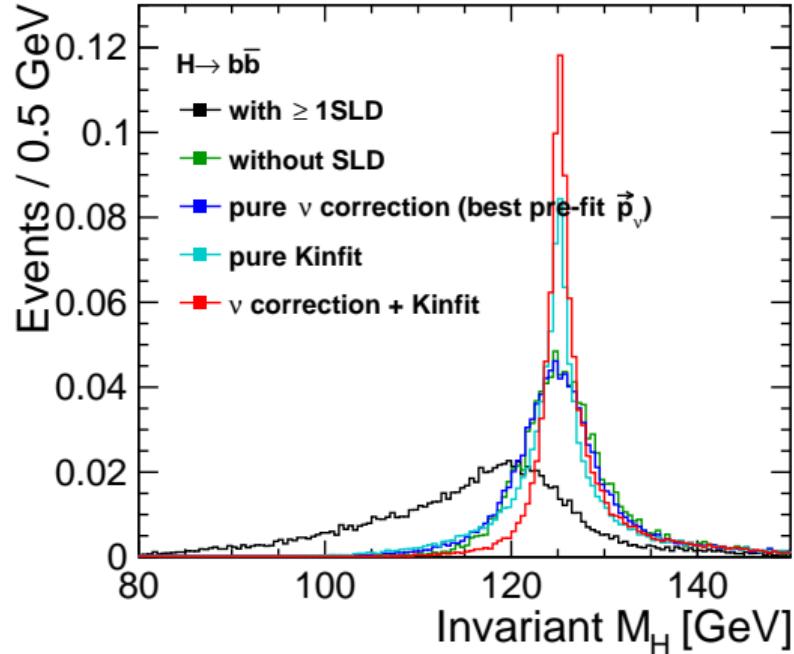
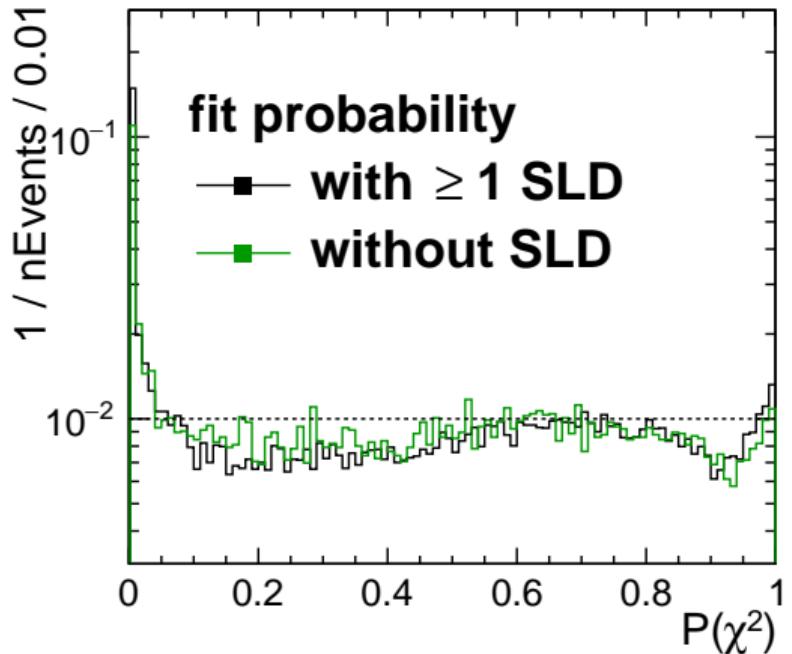


By neutrino correction, initial value of constraint function closer to target  $\Rightarrow$  fit should work better!



## Higgs mass in presence of SLDs

$\nu$ -correction and kinematic fit on  $H \rightarrow b\bar{b}$



- ▶ Applying **kinematic fit and  $\nu$ -correction** gives huge improvement on Higgs mass reconstruction

