



**University of  
Zurich<sup>UZH</sup>**

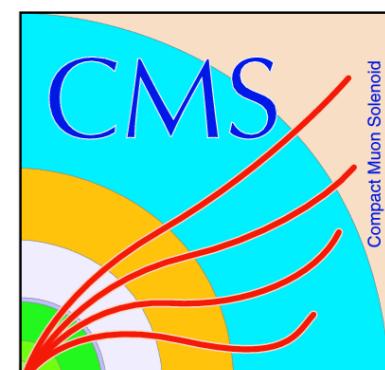
**Physik-Institut**

# **Improving $M_{bb}$ resolution in $ZH \rightarrow llbb$**

**Two staged approach : b-specific jet corrections  
followed by jet corrections with MET**

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**VHbb meeting  
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CERN**





- > The Higgs dijet invariant mass is the most effective discriminant to distinguish the Higgs signal from backgrounds
  - Higgs-signal → Gaussian-like resonance
  - Backgrounds → exponential-like smoothly falling
- > Improving the jet energy resolution improves the Higgs dijet invariant mass resolution
- > Jet energy resolution =  $\text{RMS}[(p_{T,\text{genB}} - p_{T,\text{recoJet}})/p_{T,\text{recoJet}}]$ 
  - $p_{T,\text{genB}}$  =  $p_T$  of the generator level b-quark
  - $p_{T,\text{recoJet}}$  =  $p_T$  of the reconstructed jet
- > **Goal:** provide an estimate of the true b-quark energy and correct the reconstructed jet energy



> CDF implemented a method based on Neural Network (ROOT) ([arxiv.org/pdf/1107.3026.pdf](https://arxiv.org/pdf/1107.3026.pdf))

- a correction function is computed using specific properties of b-jets as input variables
- target the  $p_T$  of the generator level b-quark
- the Higgs dijet invariant mass resolution improved from ~15% to ~11% (~27%) in WInHbb

> Similar regression implemented for CMS ([Niklas Mohr talk for Hbb meeting](#))

- BDT regression implemented in TMVA
- input variables: b-specific properties, jet kinematic and MET-related information
- target generator level jet- $p_T$
- the two jets are kept uncorrelated in the training
- Higgs dijet invariant mass resolution improvement of ~20% in ZIIHbb



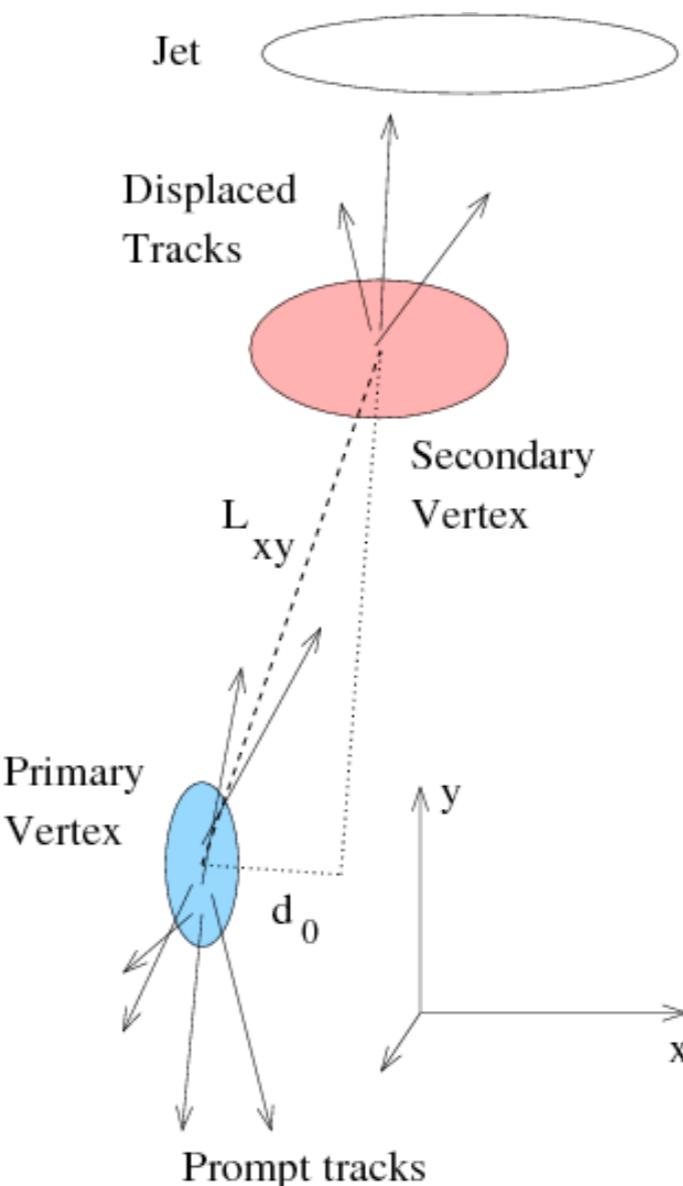
## > Large lifetime of B-hadrons ( $\sim 1.5\text{ps}$ )

- observable flight distance
- secondary vertex displaced from the primary vertex

## > Large multiplicity of charged particles in the final state

## > Large mass

- charged particle tracks incompatible with the primary vertex
- high impact parameter



## Goal:

improving individual b-jet energy measurement and resolution  
exploiting the correlation between the b-specific properties  
and the b-jet energies

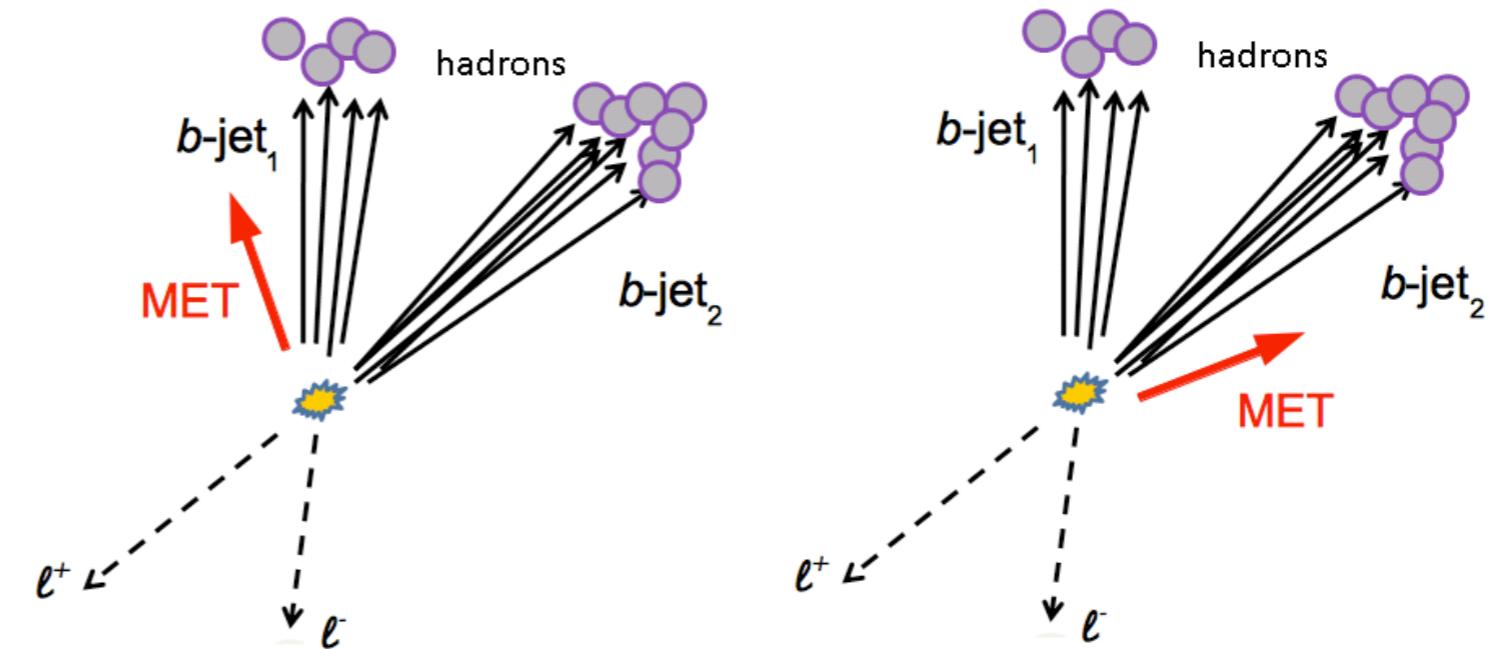
## > Presence of Missing Transverse Energy

- calorimeter resolution
  - presence of neutrino in the jet
- mis-measurement of the b-jet energy

## > The MET direction points in the direction of the jet that is more likely mis-measured

ZH → llbb events

$$\sum \vec{p}_{T,\text{lep}} + \sum \vec{p}_{T,\text{jet}} \neq \vec{0}$$



## Goal:

exploit the MET value and direction compared to the jet to correct the reconstructed jet energies



- > A correction function is computed in order to approximate the reconstructed b-jet energy to the MC generated b-quark energy
- > The method exploits Multi-Layer Perceptron Neural Networks (implemented in ROOT) in two steps:

## 1.

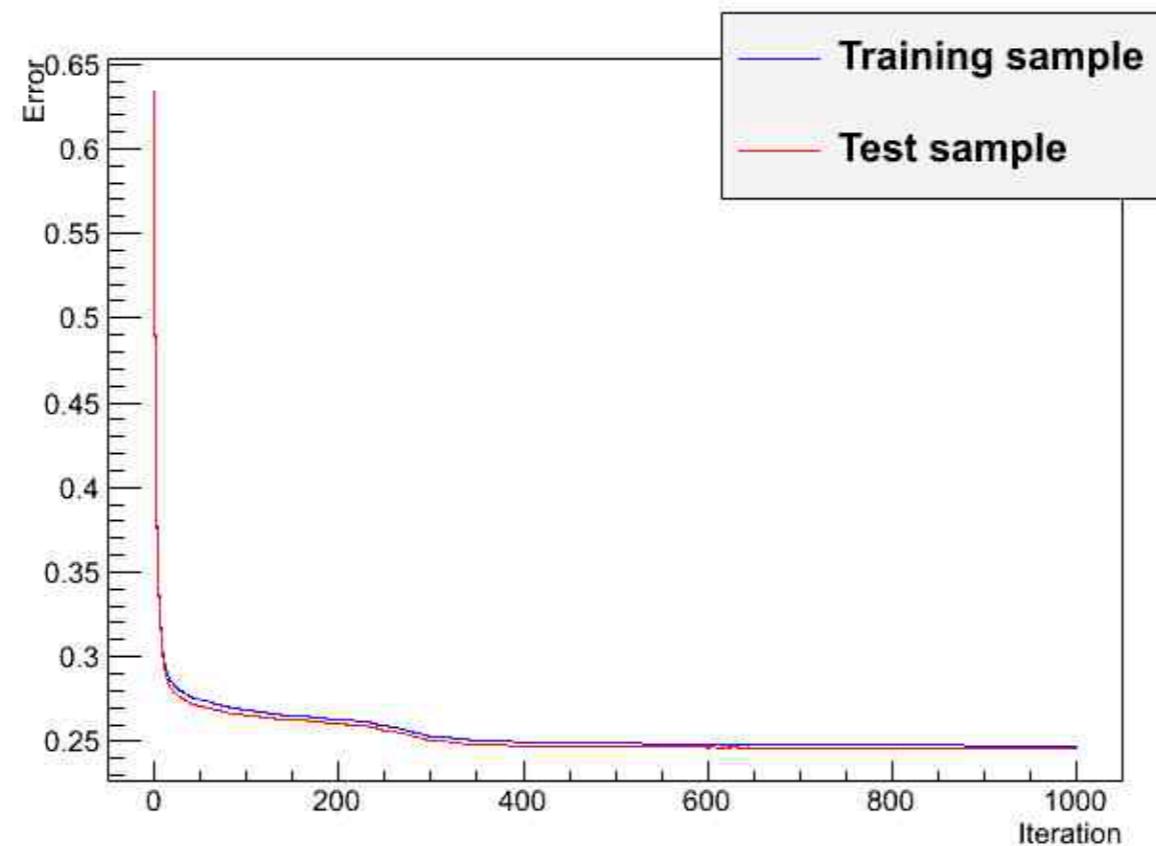
- A first NN is trained using
  - **b-specific input variables (Secondary Vertex)**
    - # tracks in the SV of the jet<sub>1,2</sub>, p<sub>T</sub> of the lead track in the jet<sub>1,2</sub>
    - vtx-mass, vtx-pT - mass and pT of the SV of the jet<sub>1,2</sub>
    - vtx-3dL, vtx-3deL - 3D flight lenght and error of the SV of the jet<sub>1,2</sub>
  - **jet kinematic input variables:**
    - standard corrected jet<sub>1,2</sub> energy and p<sub>T</sub>
- Target two scale factors (one for each jet): **SF = p<sub>T,genB</sub>/p<sub>T,recoJet</sub>**
- Outputs: two correction factors which are applied to the jets  
→ NNb-corrected jets energy, jets pT, MET

16 input  
variables

pT of the generator level  
b-quark: **NEW in CMS!**

# NN training

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- BFGS method with 1 hidden layer of 32 neurons for 1000 epochs
- On a sample of b-tagged jets from Higgs candidate matching the generator level b-quarks, chosen from a MC of ZIIHbb events  
@  $M_H = 125\text{GeV}$
- jet-quark match  $\rightarrow dR = \sqrt{(\phi_{genB} - \phi_{jet})^2 + (\eta_{genB} - \eta_{jet})^2} < 0.5$



## 2.

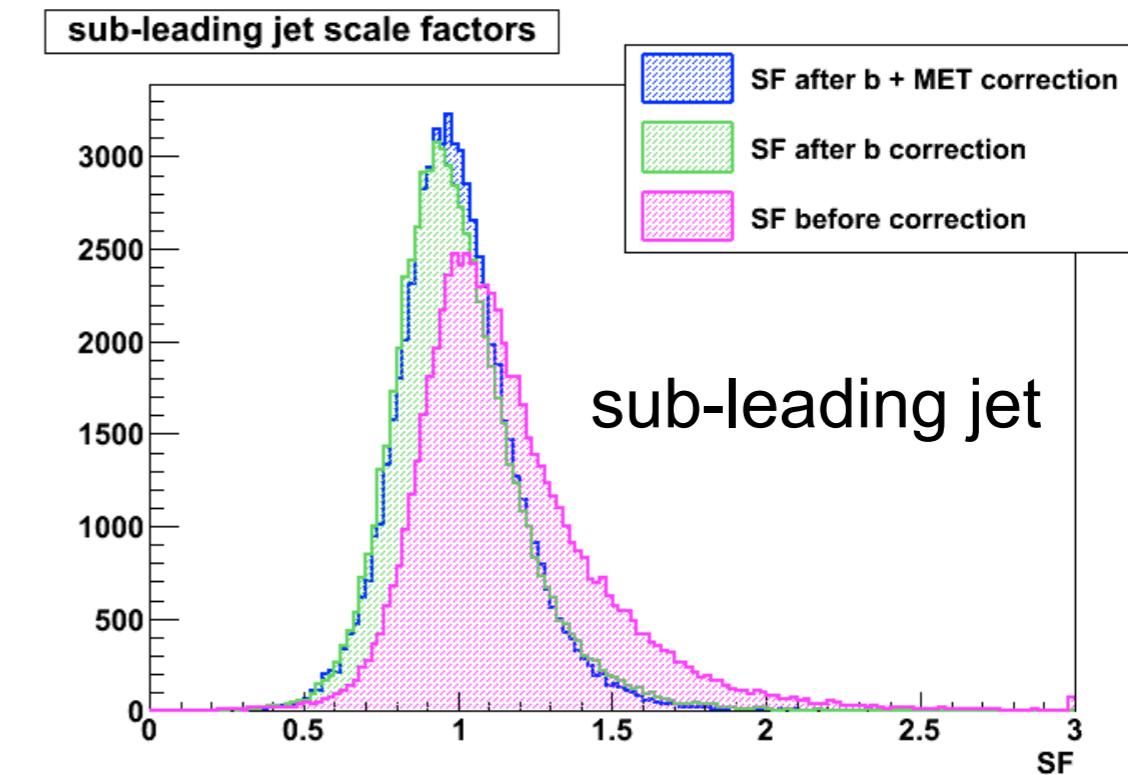
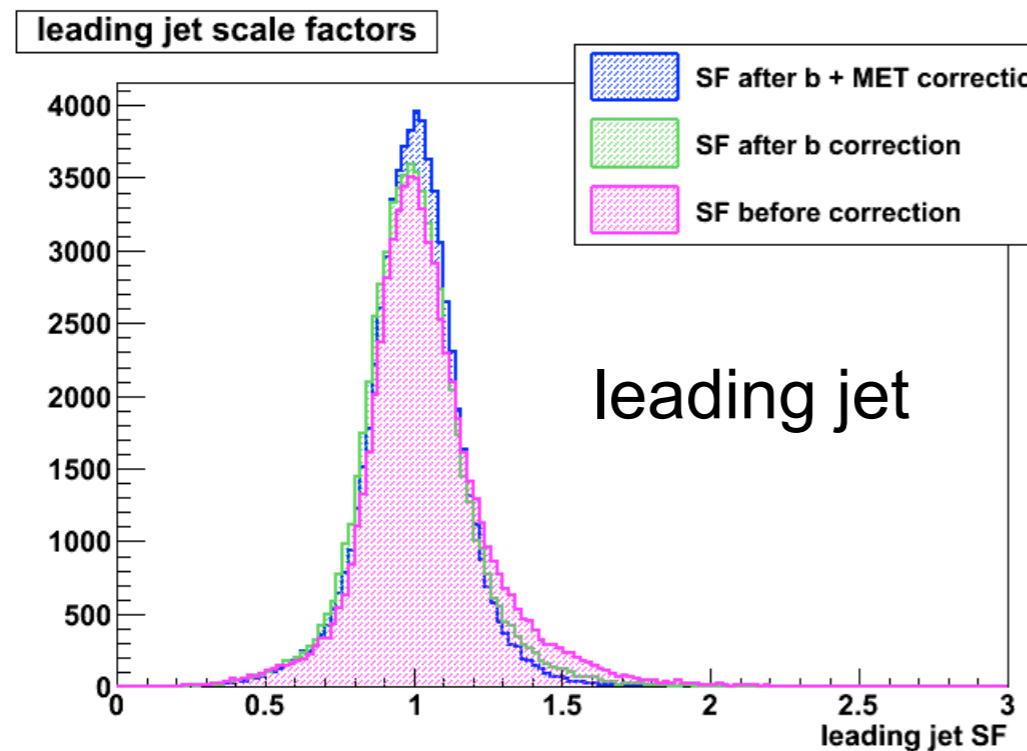
- A second NN is trained using
  - **MET input variables**  
b-corrected MET, MET phi, MET-jet<sub>1,2</sub> projection
  - **jet kinematic input variables:**  
NN<sub>b</sub> corrected jet<sub>1,2</sub> energy and p<sub>T</sub>, jet<sub>1,2</sub> eta, jet<sub>1,2</sub> phi
  - **PU correction:**  
# Primary vertices
- Target two scale factors (one for each jet): **SF = p<sub>T,genB</sub>/p<sub>T,recoJet</sub>** (**NN<sub>b</sub>-corr**)
- Outputs: 2 correction factors which are applied to the jets  
→ NN<sub>b</sub>+NN<sub>MET</sub> - corrected jets energy and jets p<sub>T</sub>
- BFGS method with 1 hidden layer of 22 neurons for 1000 epochs
- On a sample of b-tagged jets matching with generator level b-quarks chosen from a MC of ZIIHbb events @ M<sub>H</sub> = 125GeV

11 input  
variables

# Scale factors

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$$\text{NNb correction}$$
$$\text{SF} = p_{T,\text{genB}}/p_{T,\text{recoJet}} \longrightarrow \text{SF}_b = p_{T,\text{genB}}/p_{T,\text{recoJet}}^{\text{(NNb-corr)}} \longrightarrow \text{NN}_{\text{MET}} \text{ correction}$$
$$\text{SF}_{\text{MET}} = p_{T,\text{genB}}/p_{T,\text{recoJet}}^{\text{(NNMET-corr)}}$$



## > Jets selection:

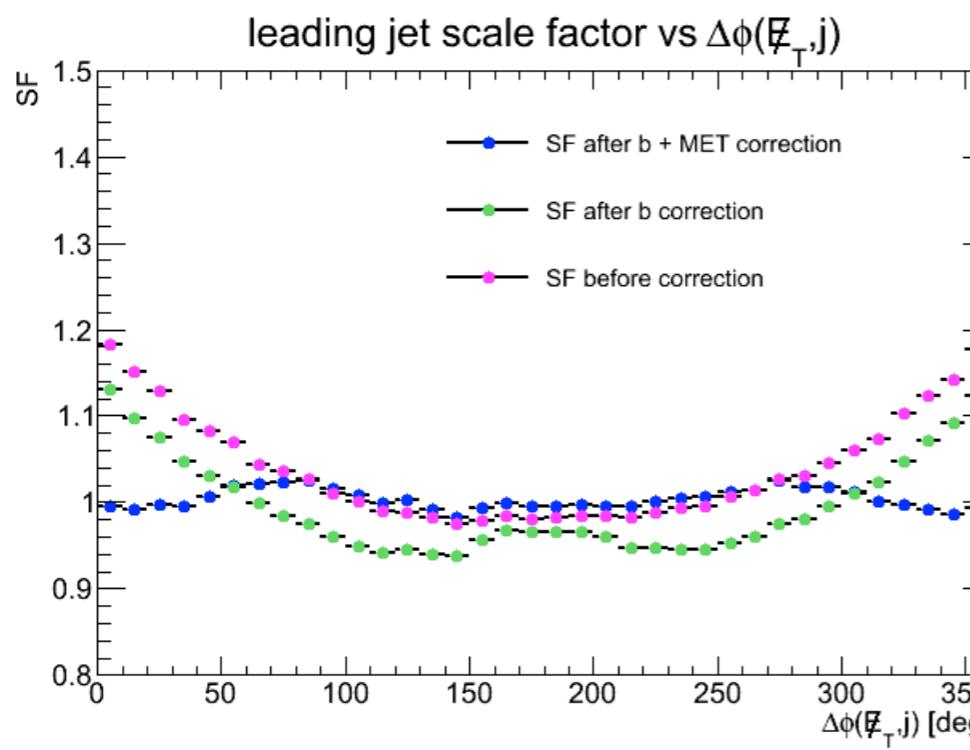
- 2 b-tagged jets from the Higgs candidate with  $pT > 20 \text{ GeV}$ ,  $dR < 0.5$
- no selection applied on additional jets

# Scale factors

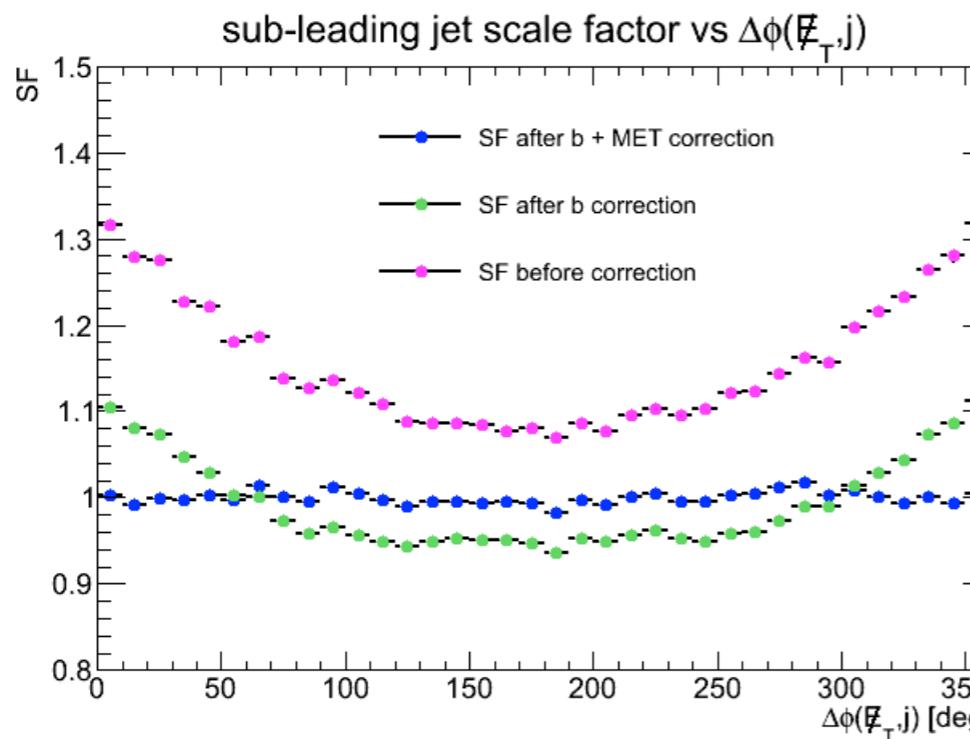
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## Scale factors vs DPhi(MET,j)

leading jet

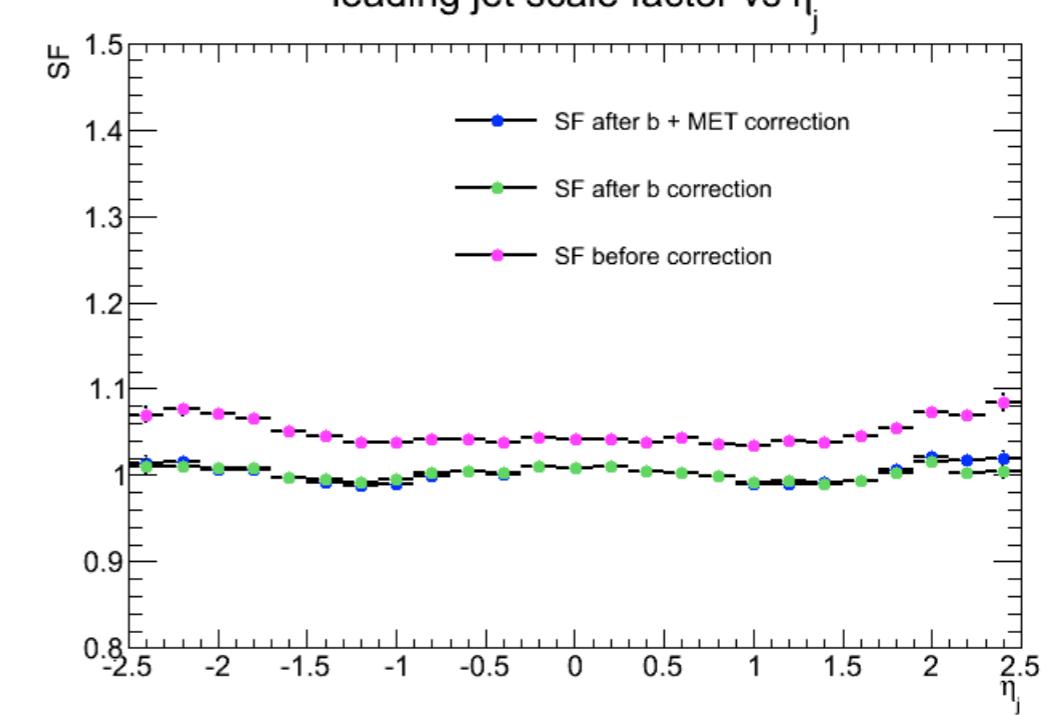


sub-leading jet

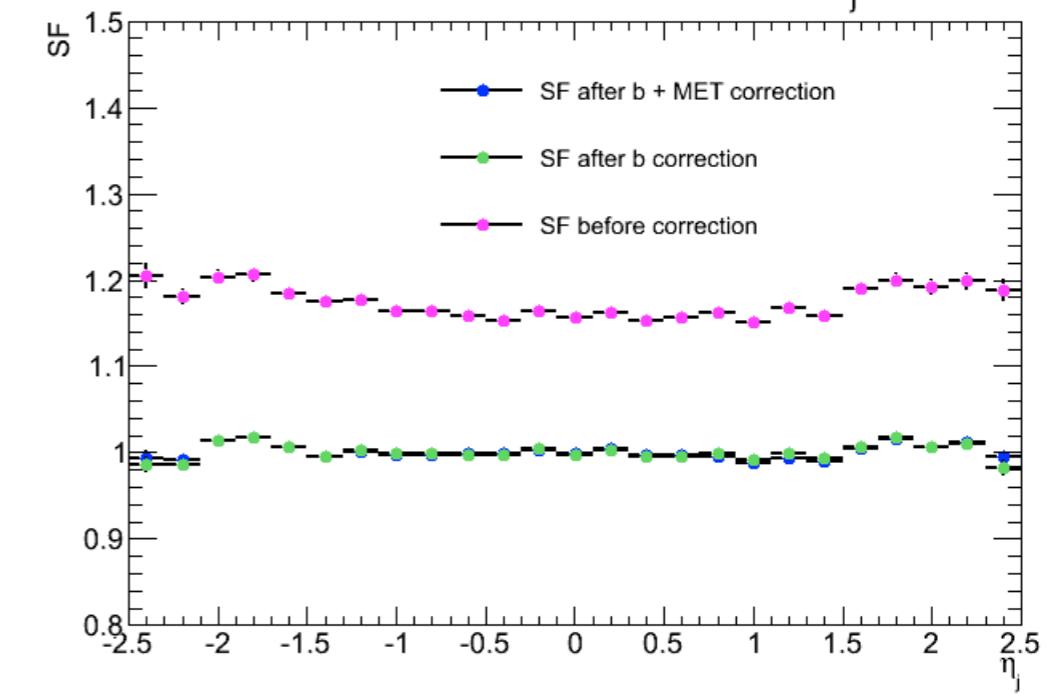


## Scale factors vs jet eta

leading jet scale factor vs  $\eta_j$

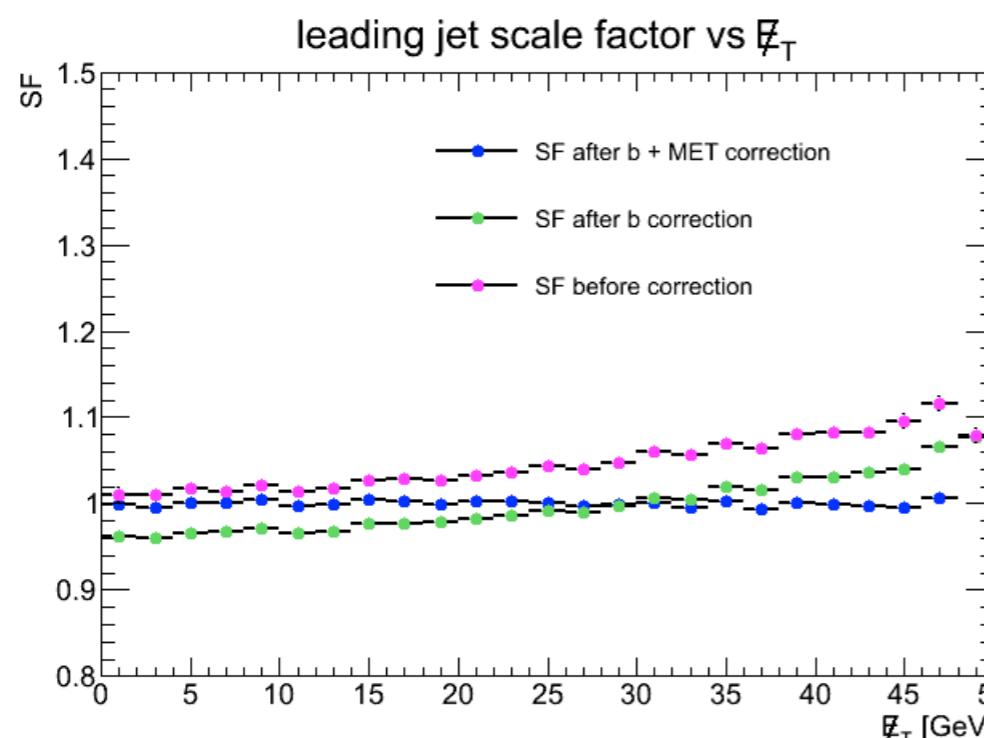


sub-leading jet scale factor vs  $\eta_j$

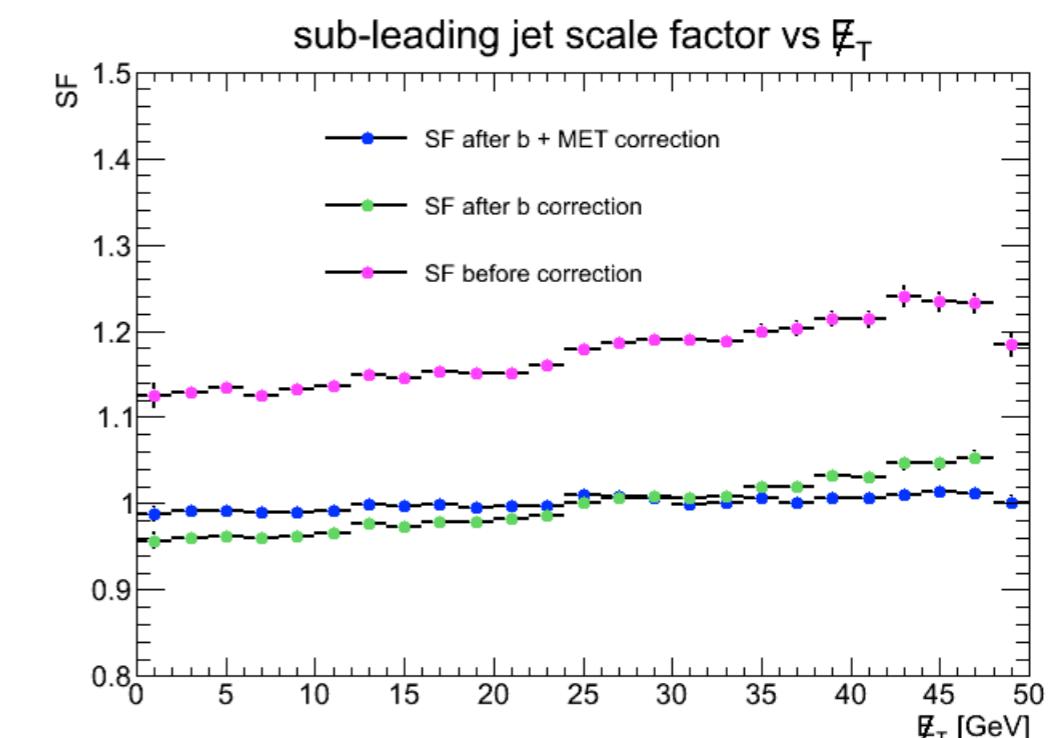


## Scale factors vs MET

### leading jet



### sub-leading jet

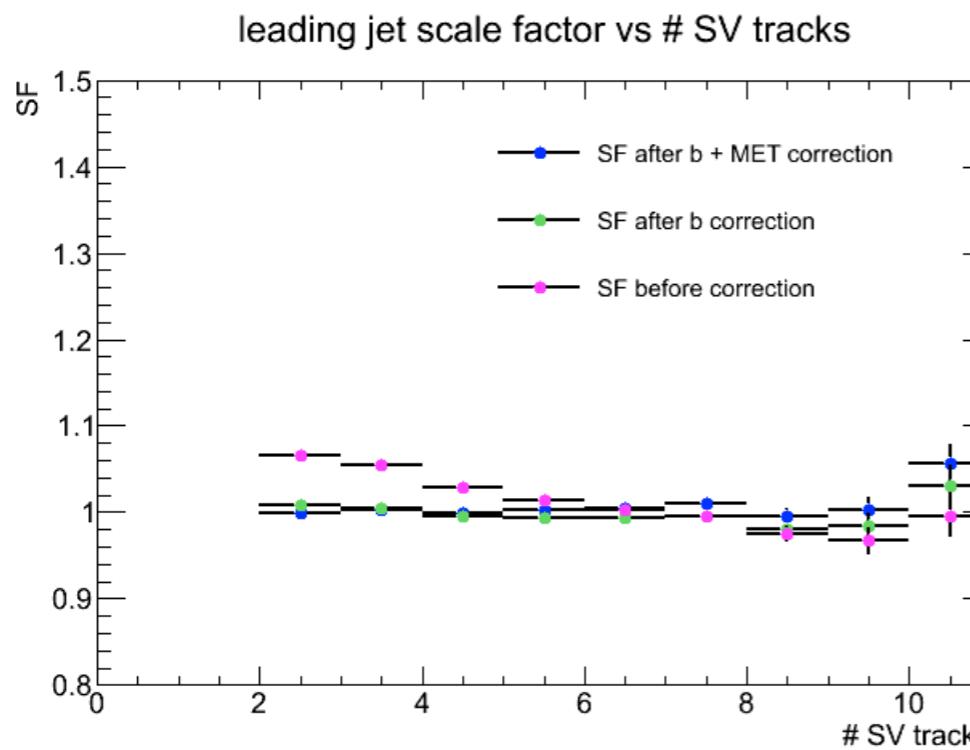


# Scale factors

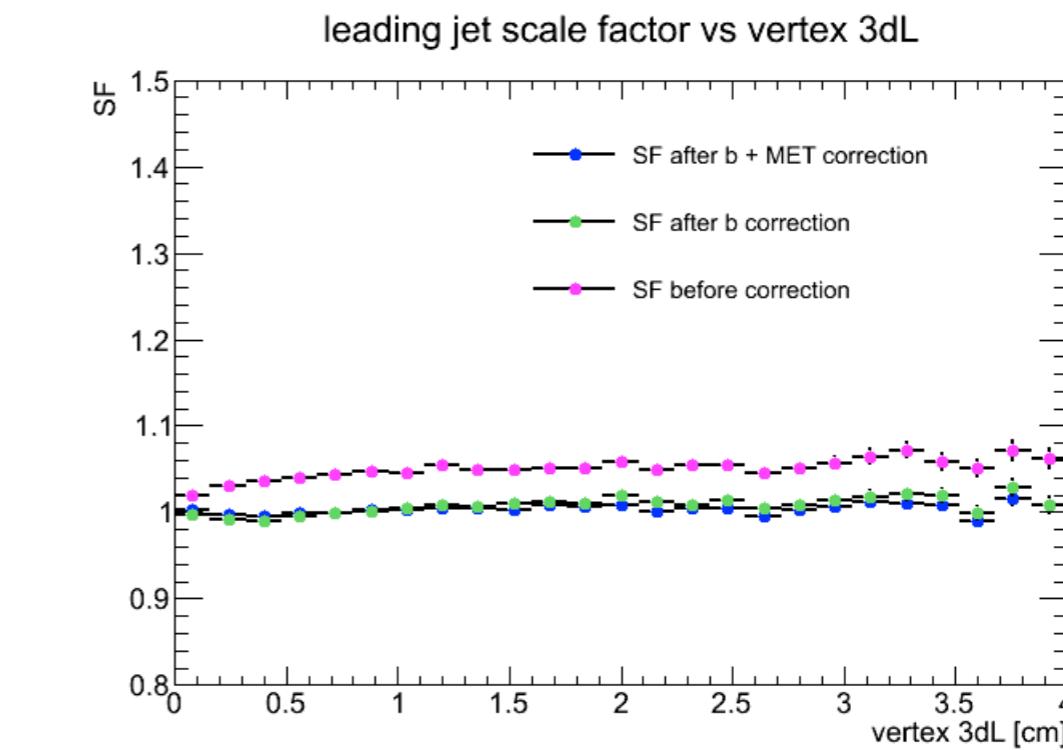
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## Scale factors vs # SV tracks

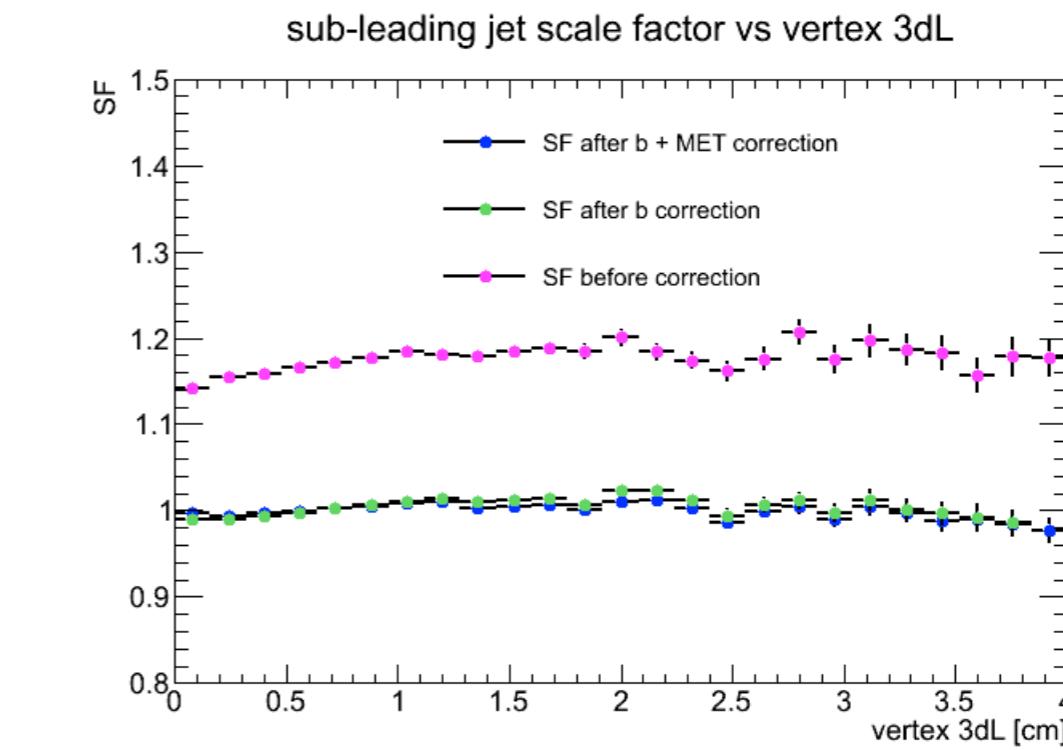
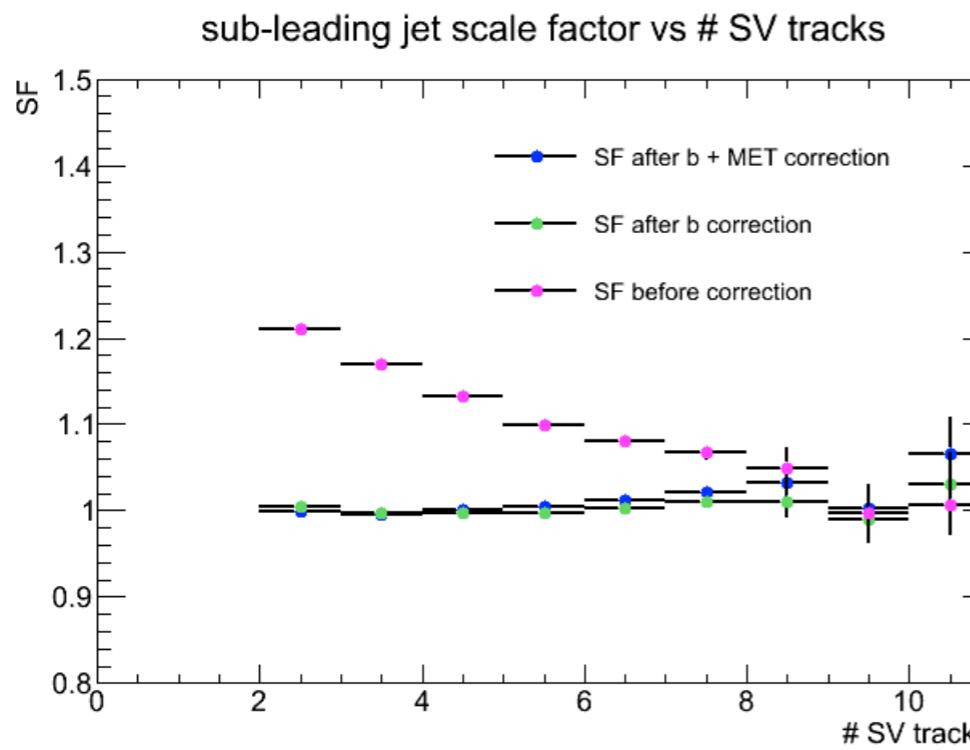
leading jet



## Scale factors vs vertex 3dL



sub-leading jet

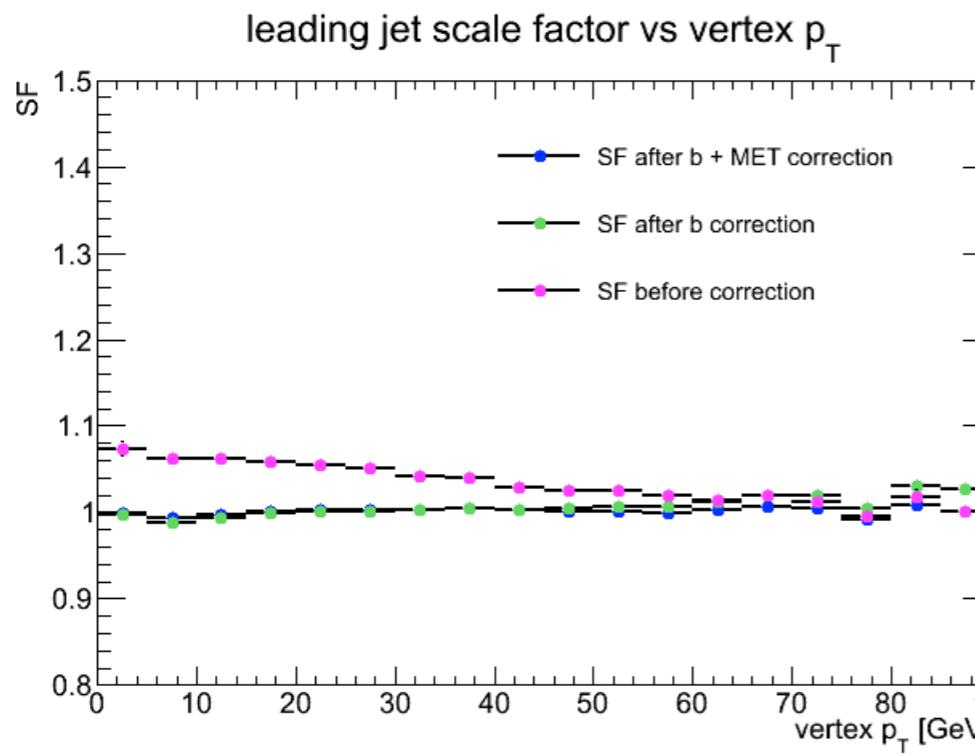


# Scale factors

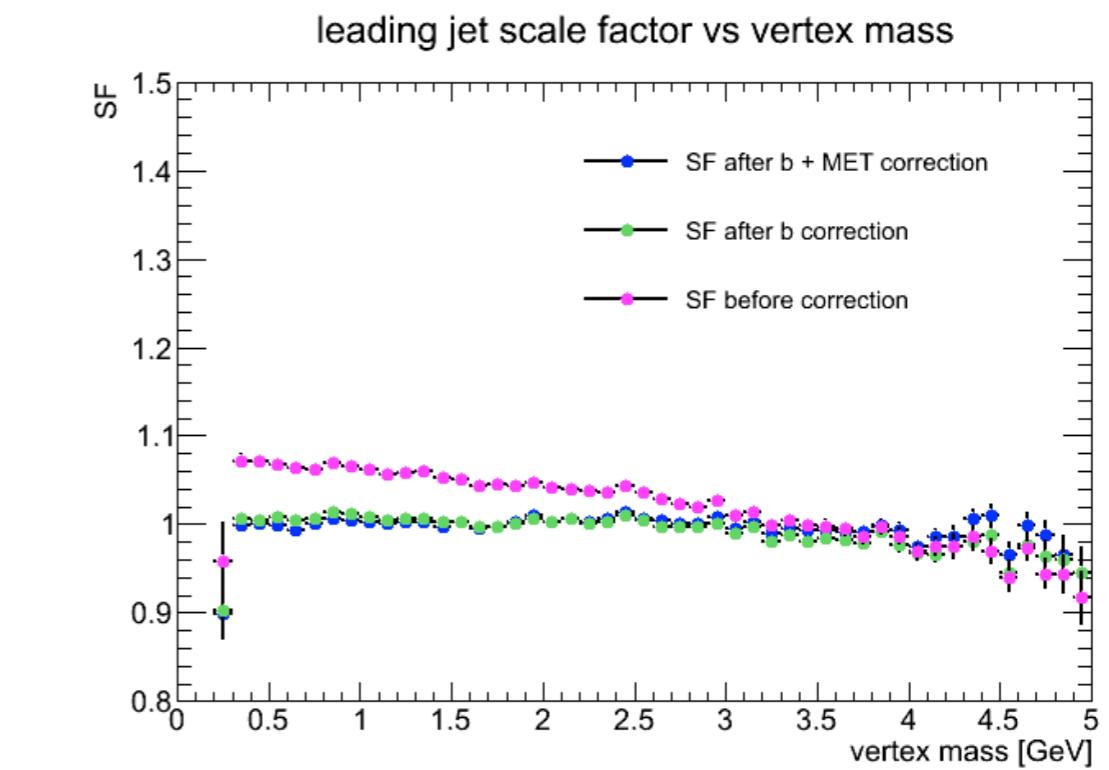
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## Scale factors vs vertex pT

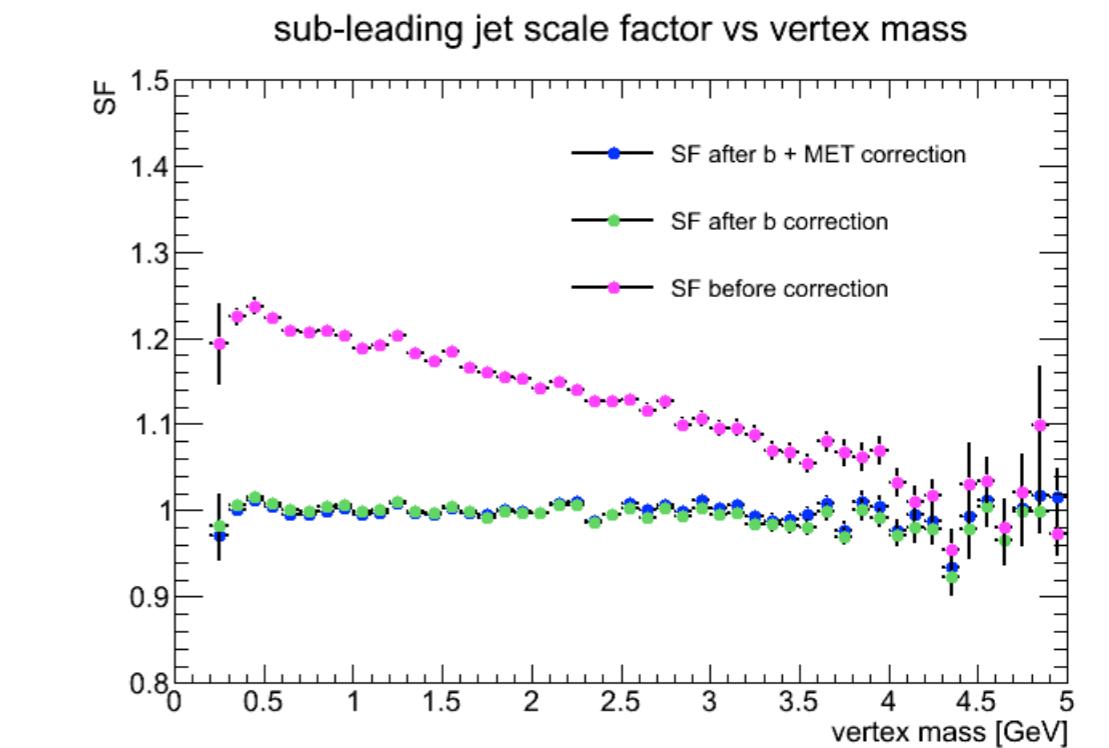
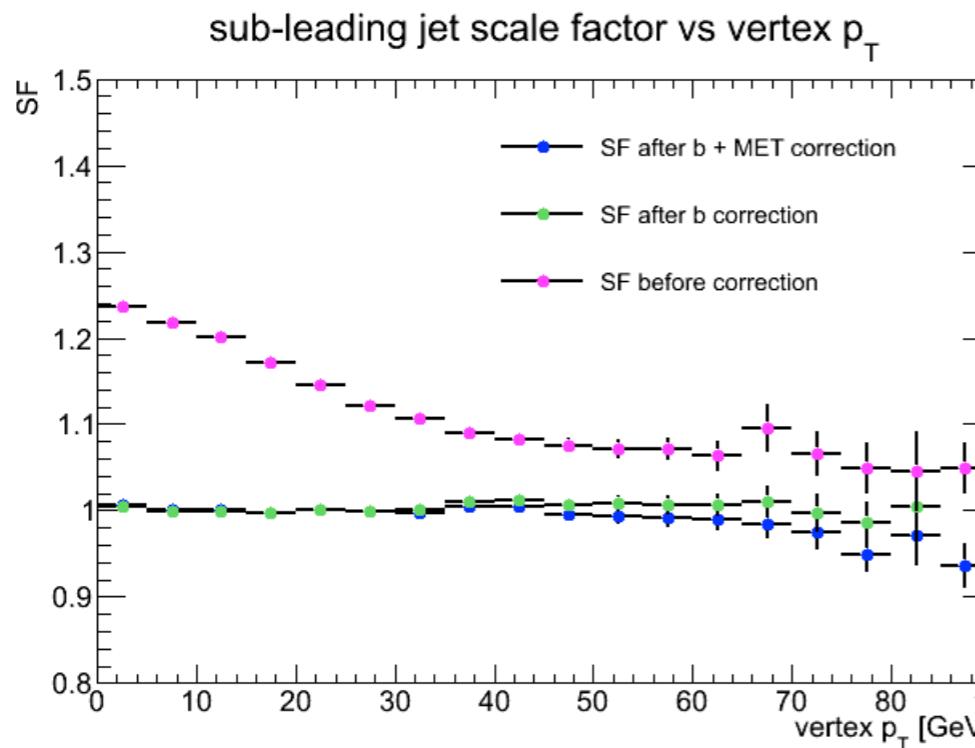
leading jet

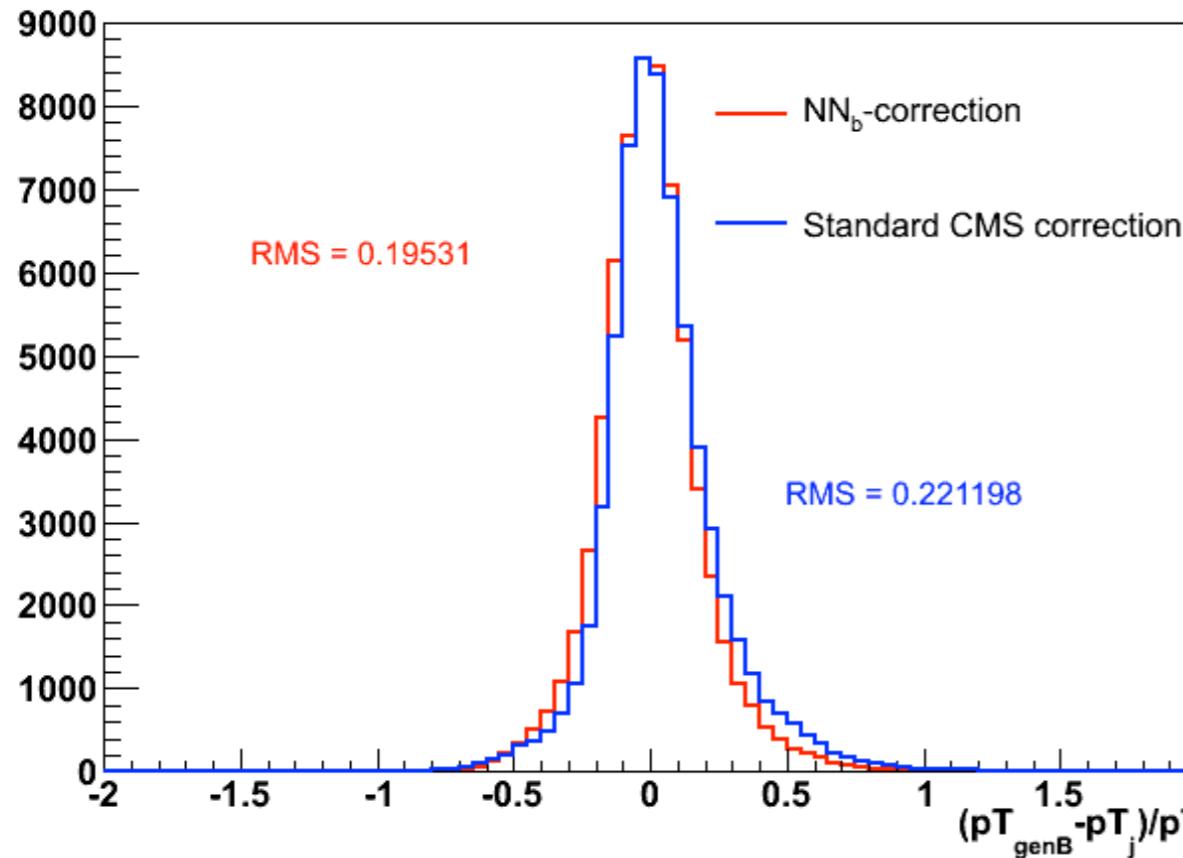


## Scale factors vs vertex mass



sub-leading jet

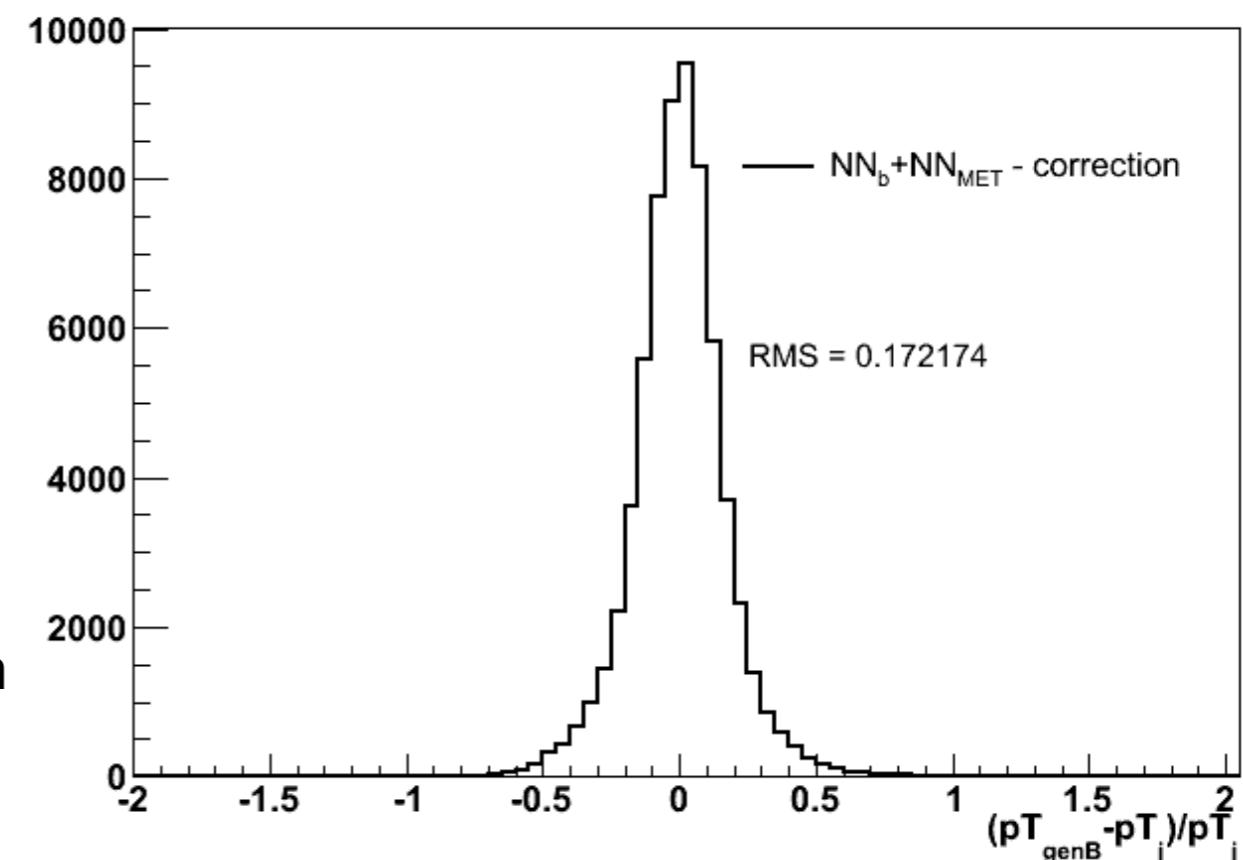


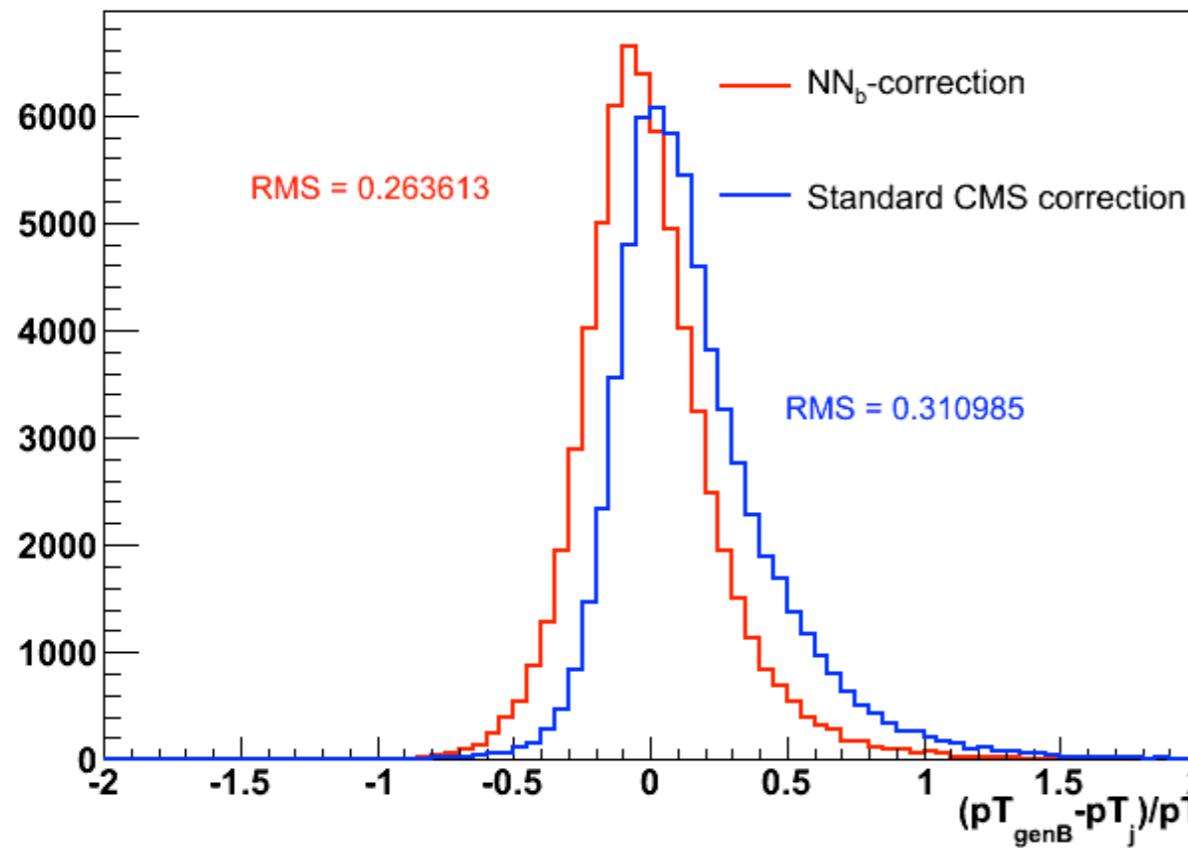
**leading jet energy resolution****> Leading jet energy resolution improved**

- from ~22% to ~20% after  $NN_b$  correction
- from ~20% to ~17% after  $NN_{MET}$  correction

**> Jets selection:**

- 2 b-tagged jets from the Higgs candidate with  $pT > 20$  GeV,  $dR < 0.5$
- no selection applied on additional jets

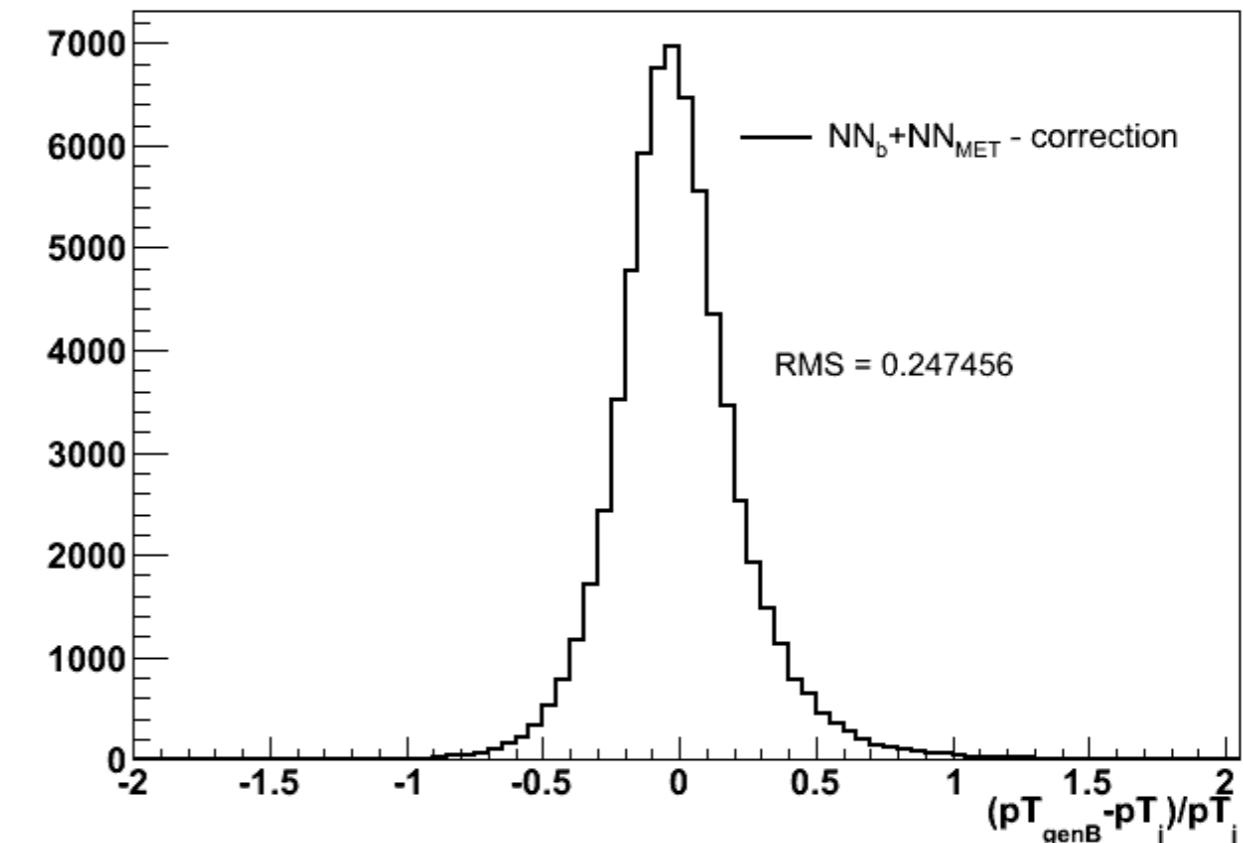
**leading jet energy resolution**

**soft jet energy resolution****> Sub-leading jet energy resolution improved**

- from ~31% to ~26% after  $NN_b$  correction
- from ~26% to ~25% after  $NN_{MET}$  correction

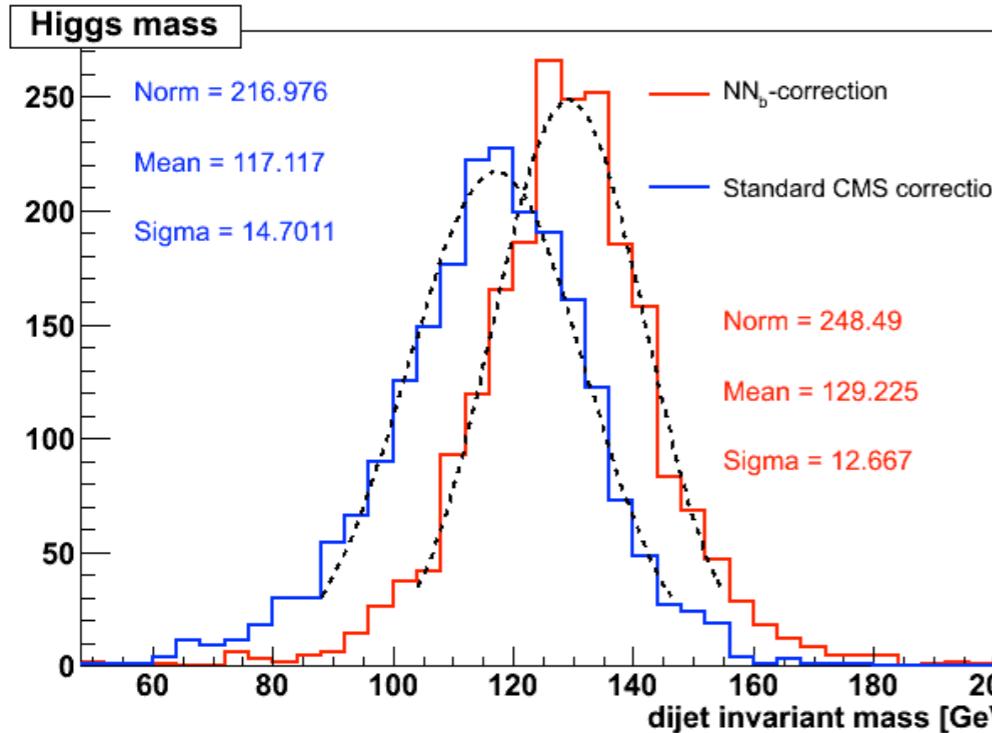
**> Jets selection:**

- 2 b-tagged jets from the Higgs candidate with  $pT > 20 \text{ GeV}$ ,  $dR < 0.5$
- no selection applied on additional jets

**sub-leading jet energy resolution**

# Reconstructed dijet invariant mass

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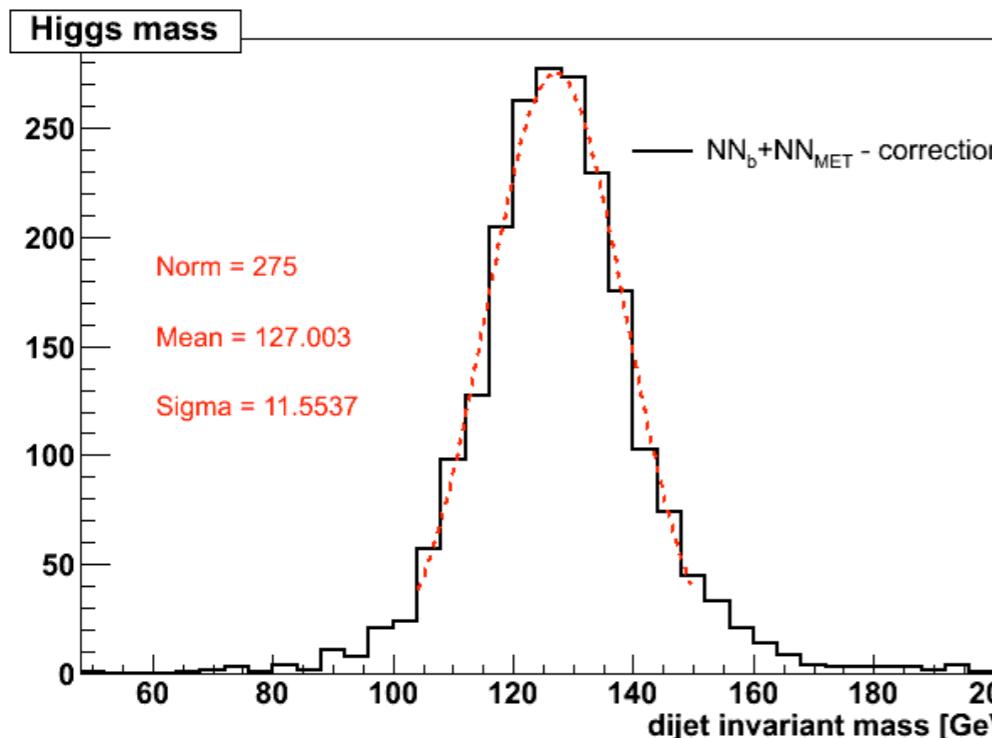


## > Leptons selection

- pT > 20 GeV
- |eta| < 2.5
- # additional leps = 0

## > Jets selection

- pT > 20 GeV
- |eta| < 2.5
- CSV I-j > 0.9
- CSV sl-j > 0.5
- # additional jets = 0
- # fat jets = 0



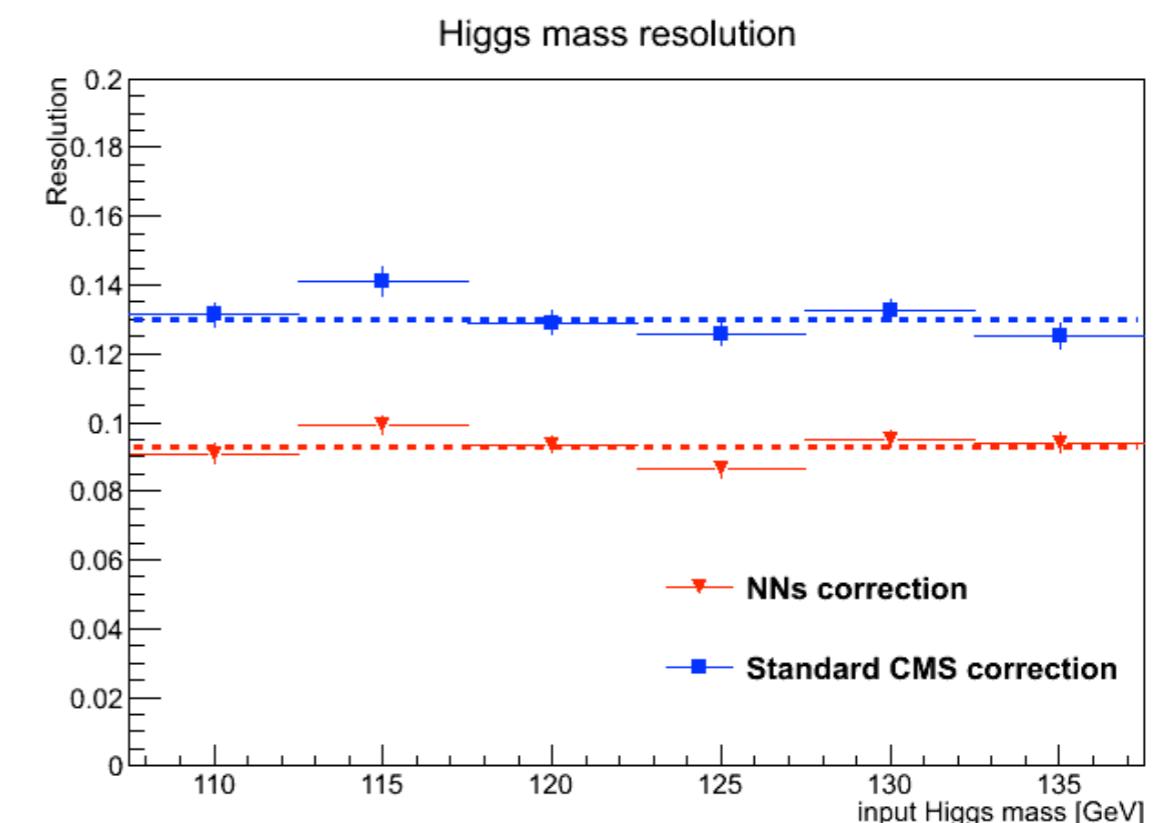
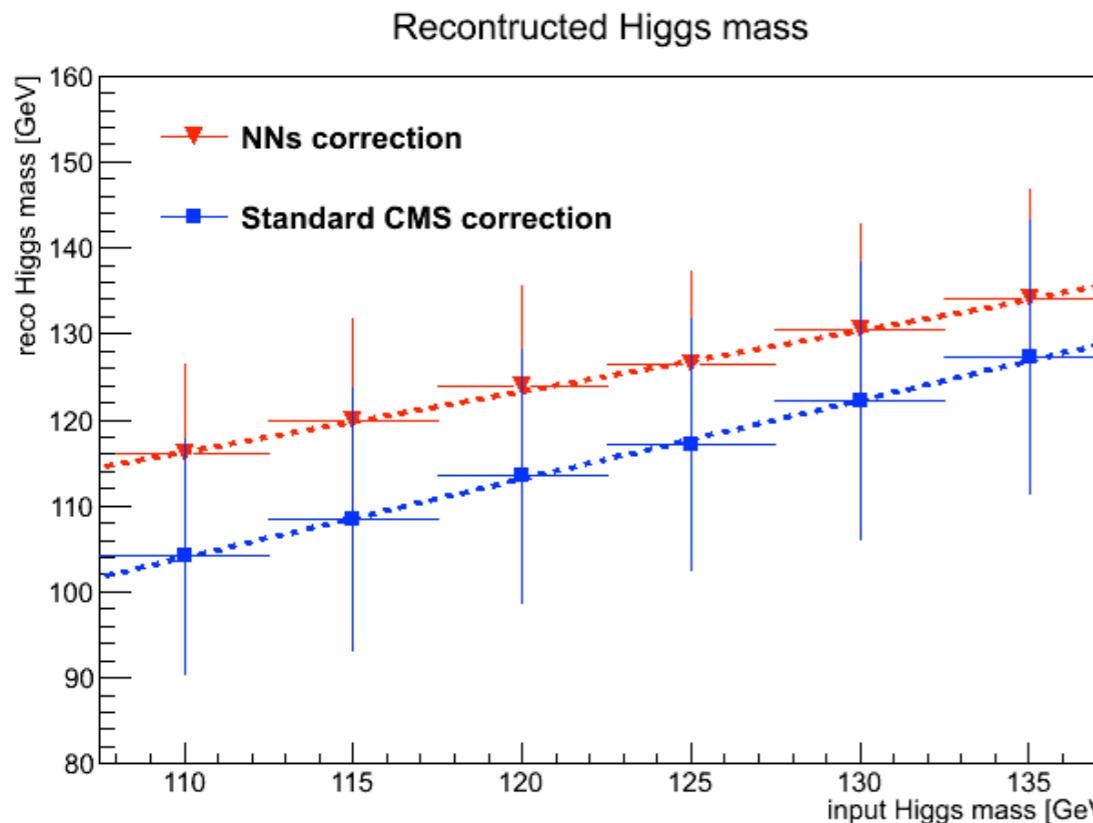
Higgs dijet invariant mass resolution  
improved

- from ~13% to ~10% after NN<sub>b</sub> correction
- from ~10% to ~9% after NN<sub>MET</sub> correction

# Reconstructed dijet invariant mass

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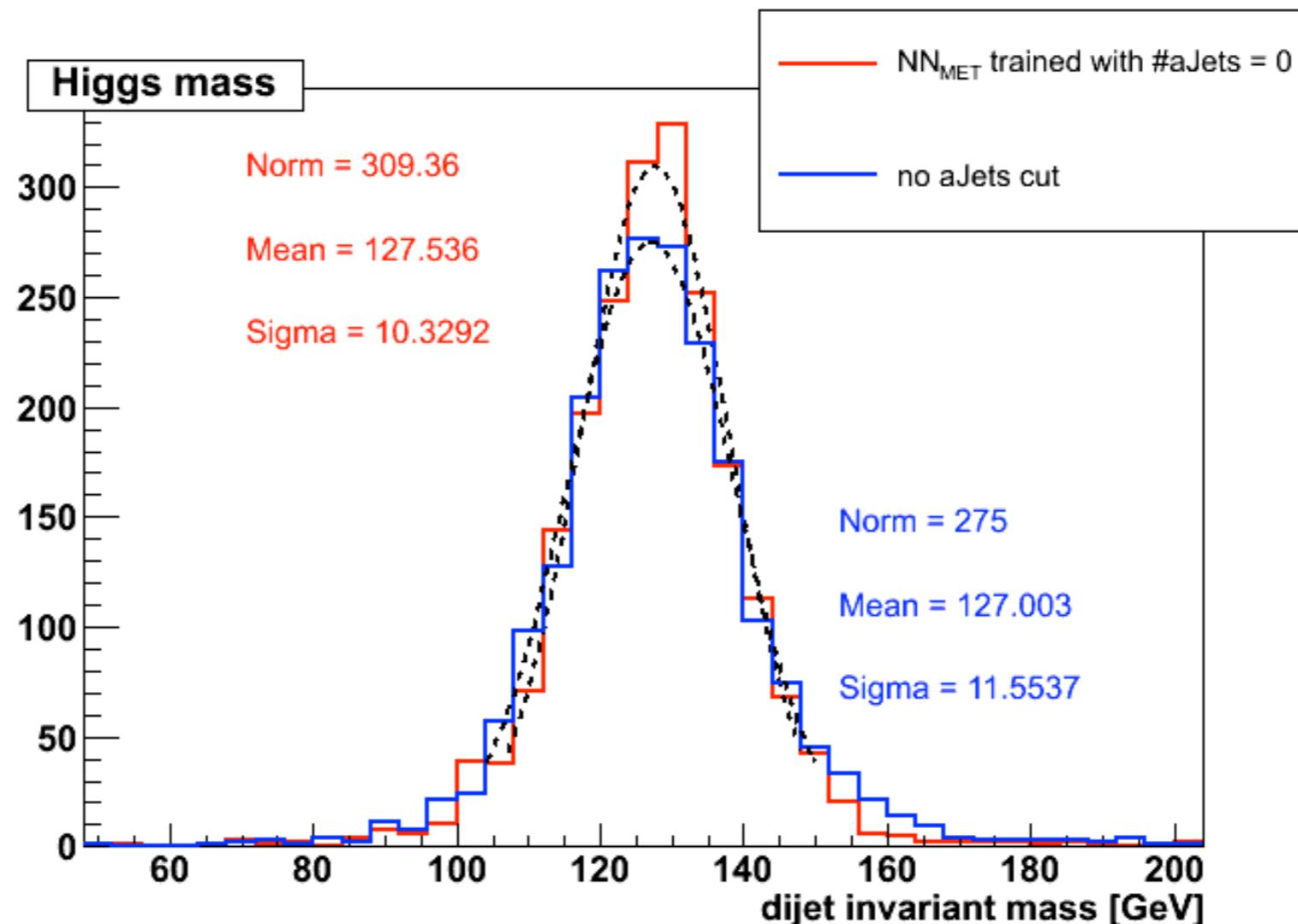
- A bias of the jet-energy correction with respect to a particular Higgs mass in the training is avoided training the NNs @ $M_H = 110\text{-}135 \text{ GeV}$  (5 GeV steps)
- Then the NN correction function is evaluated on each of the Higgs boson masses in the range
- Resolution improved from the standard-corrected jets result of ~13% to the NNs-corrected jets result of ~9% (~30%)



# Reconstructed dijet invariant mass

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- NN<sub>MET</sub> trained again on a sample of events where no additional jets are found apart from the Higgs candidate jets
  - further improvement of the Higgs mass resolution from ~9% to ~8%





- > Used new approach to perform two-stage jet energy correction
  - b-specific corrections on jet-by-jet basis
  - MET-specific corrections on event-by-event basis
  - Maintains correlations between MET and both jets
- > Obtained improvement in  $M_{jj}$  resolution to 8-9%
- > Some additional studies to do
  - Tests of background sculpting
- > Look forward to contributing to Hbb group !