

Measurement of Lepton-Jet correlation in DIS with H1 at HERA, using machine learning for unfolding

**Miguel Arratia**

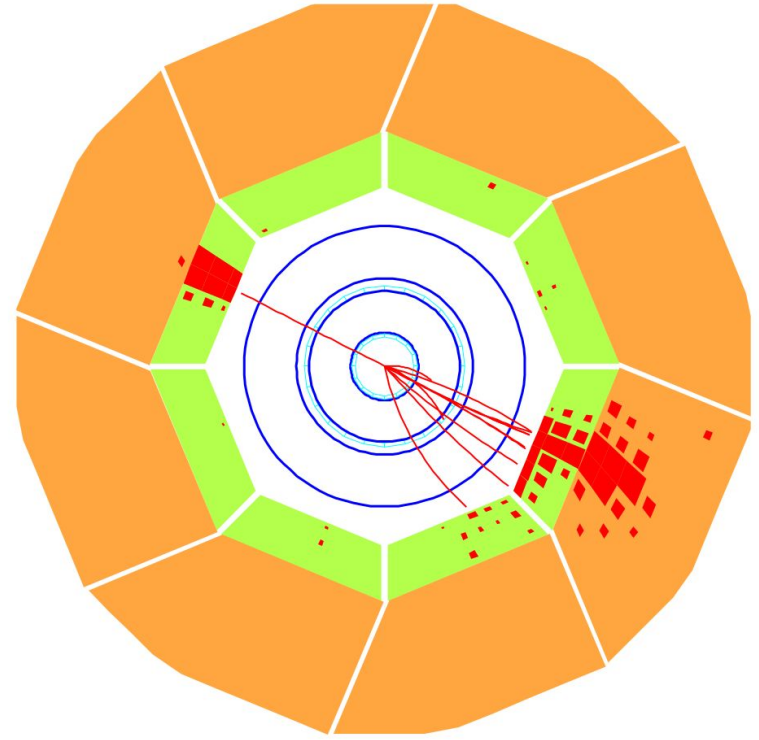
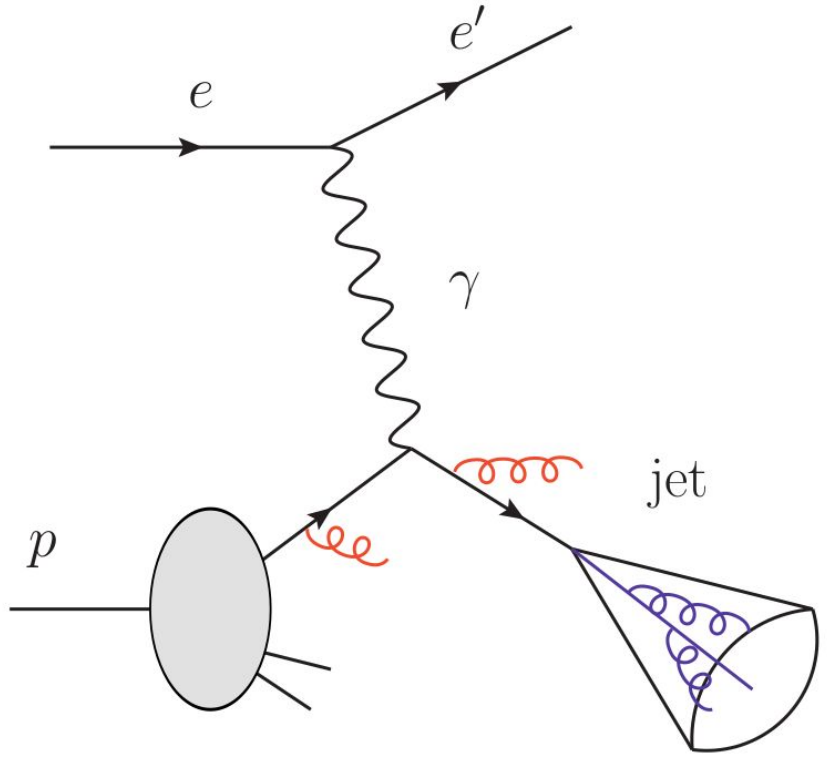


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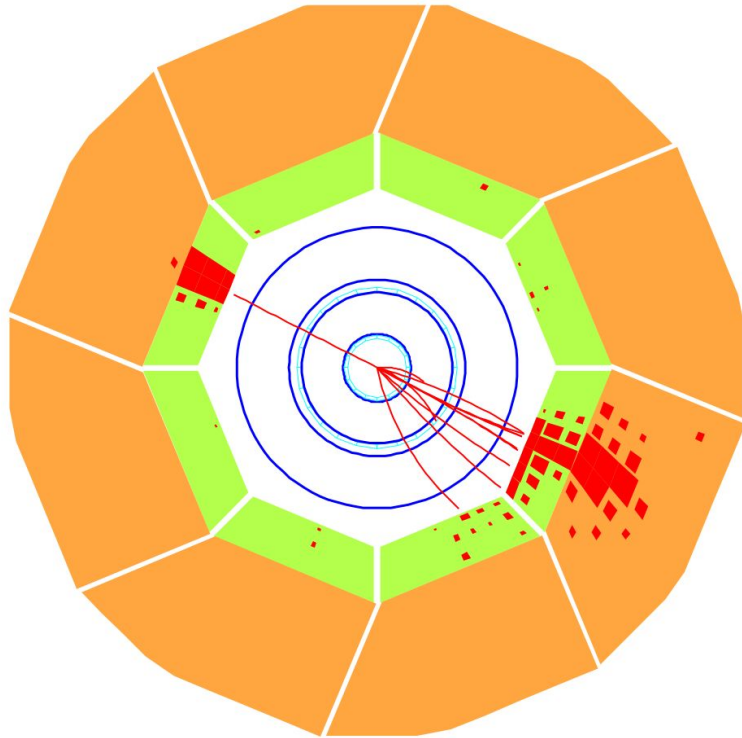
# DIS Born-level configuration

$$\gamma^* q \rightarrow q$$



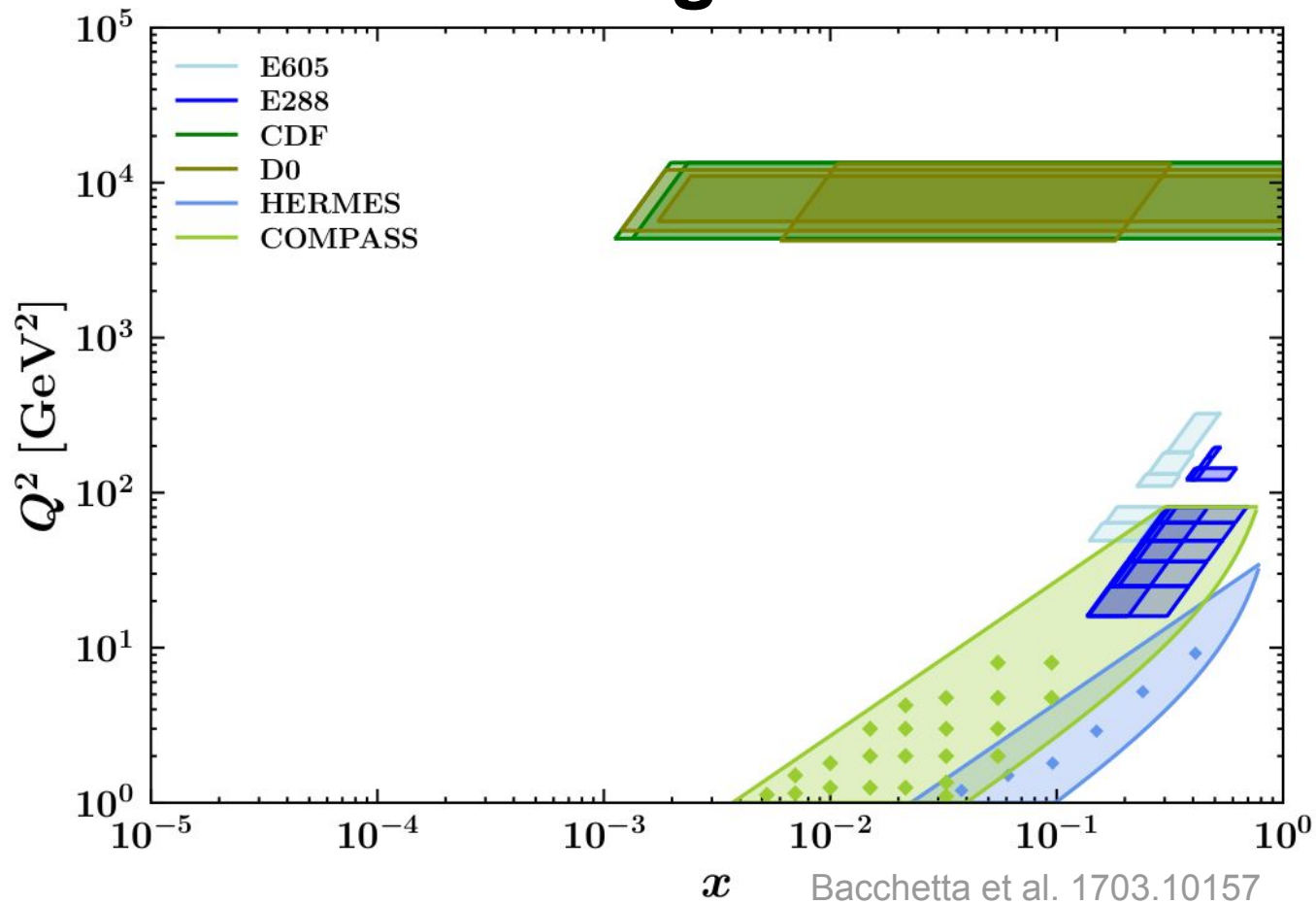
# A new channel to probe for quark transverse-momentum distributions (TMDs) and evolution

Liu et al. PRL. 122, 192003, Gutierrez et al. PRL. 121, 162001



*“The advantage of the lepton-jet correlation as compared to the standard SIDIS processes is that it **does not involve TMD fragmentation functions.**”*

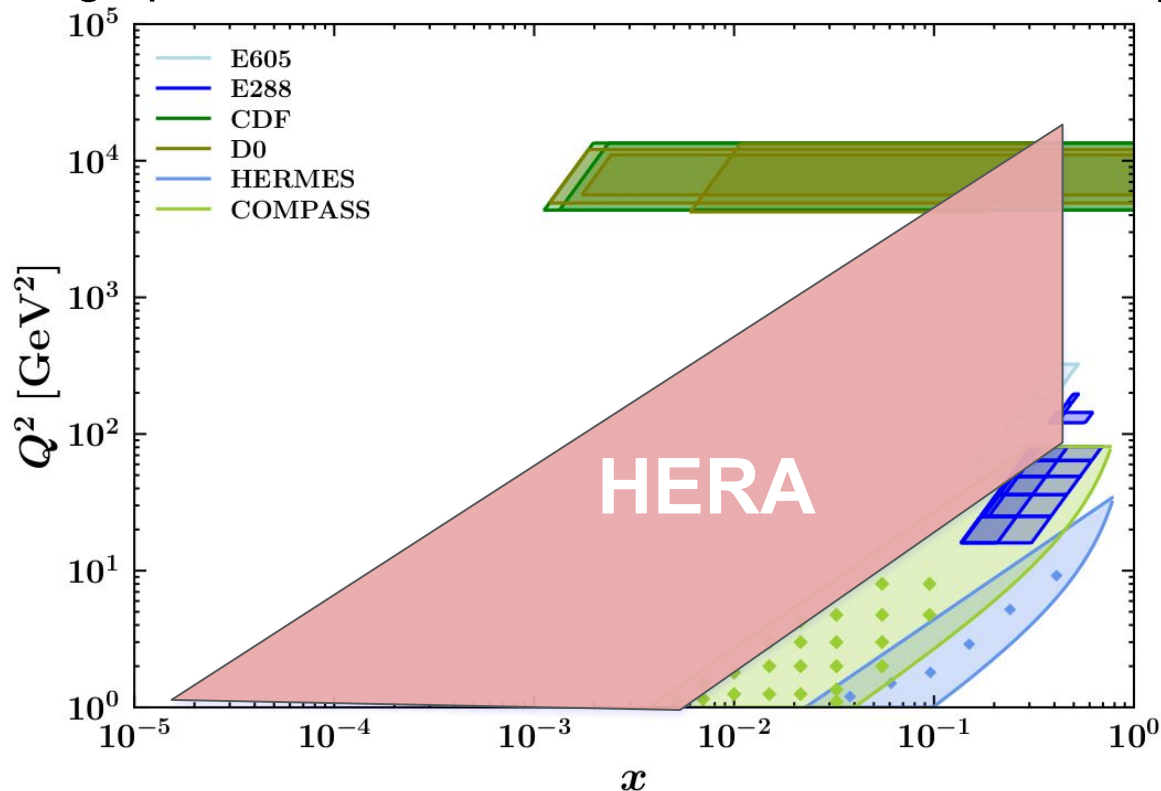
# Existing TMD data



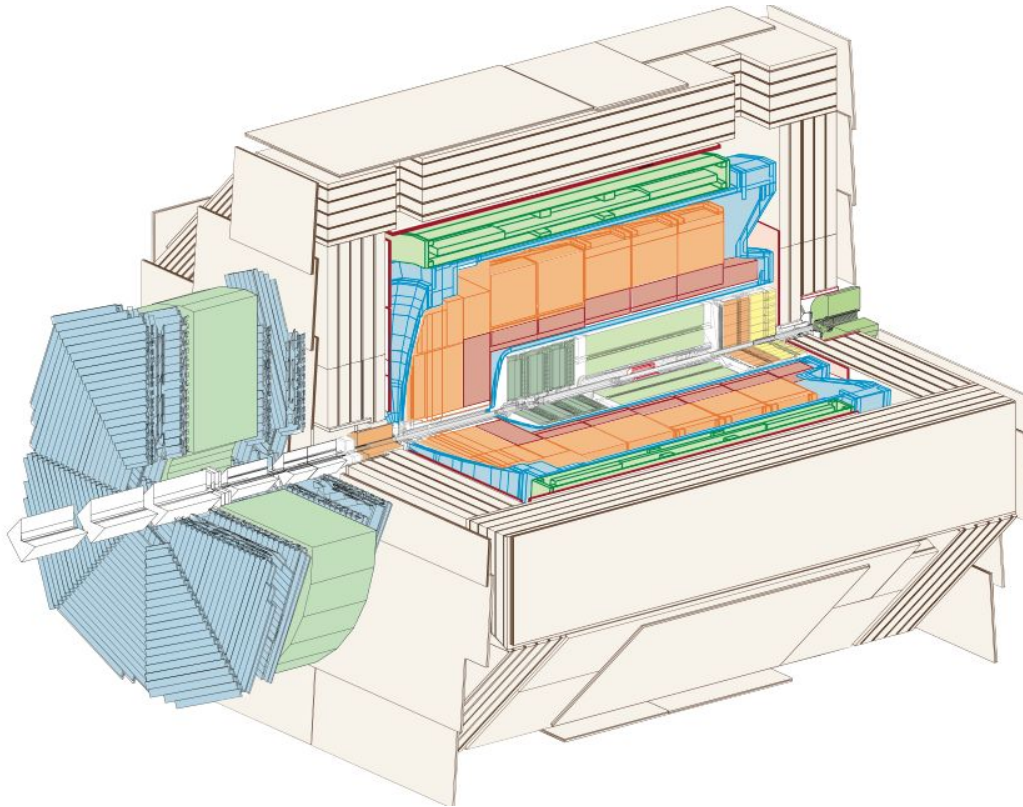
# Constraining TMD evolution with HERA data

Bridging DIS from fixed-target exp. and high  $Q^2$  Drell-Yan at colliders.

Fixing open issues of TMD factorization & universality



# The H1 experiment at HERA



- Tracking system  
(silicon tracker, jet chambers,  
proportional chambers)
- LAr calorimeter (em/had)
- Scintillating fiber calorimeter

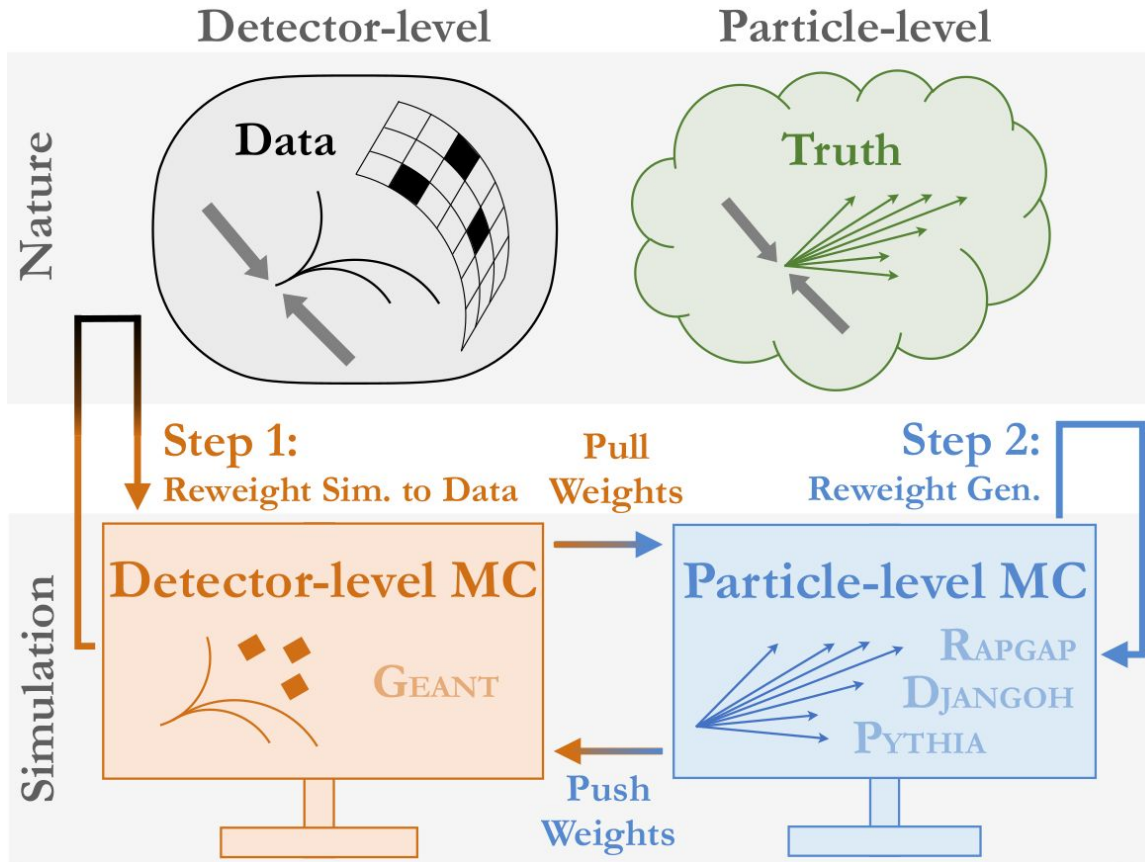
**Both combined using  
an energy flow algorithm**

1% Jet energy scale

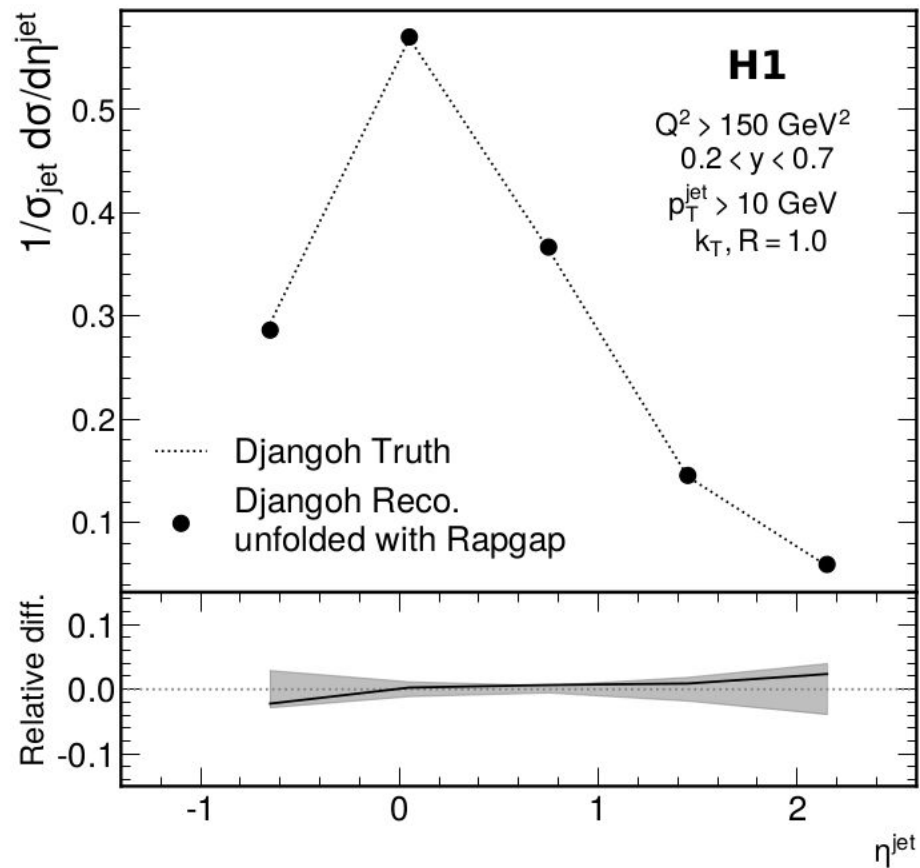
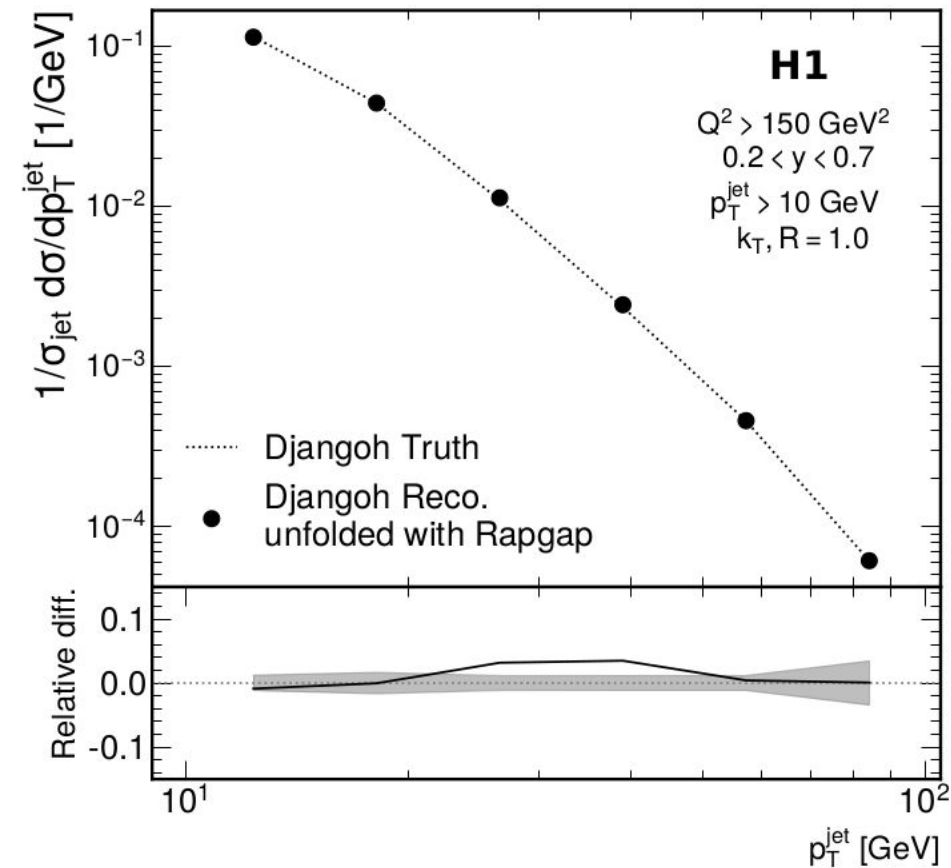
0.5-1% lepton energy scale

# Unfolding with Omnifold (via machine-learning).

Andreassen et al. PRL **124**, 182001 (2020)

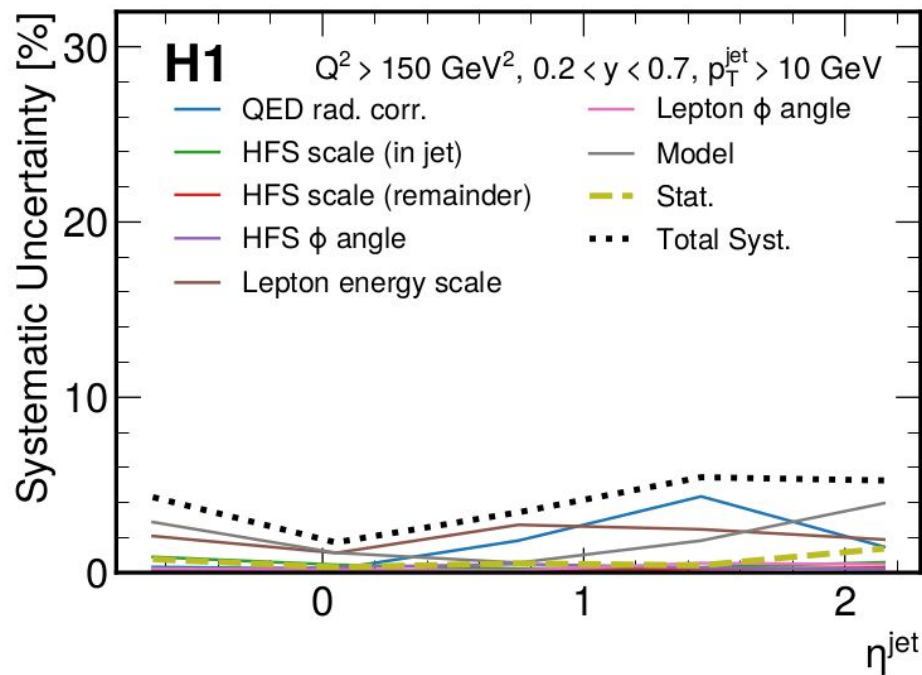
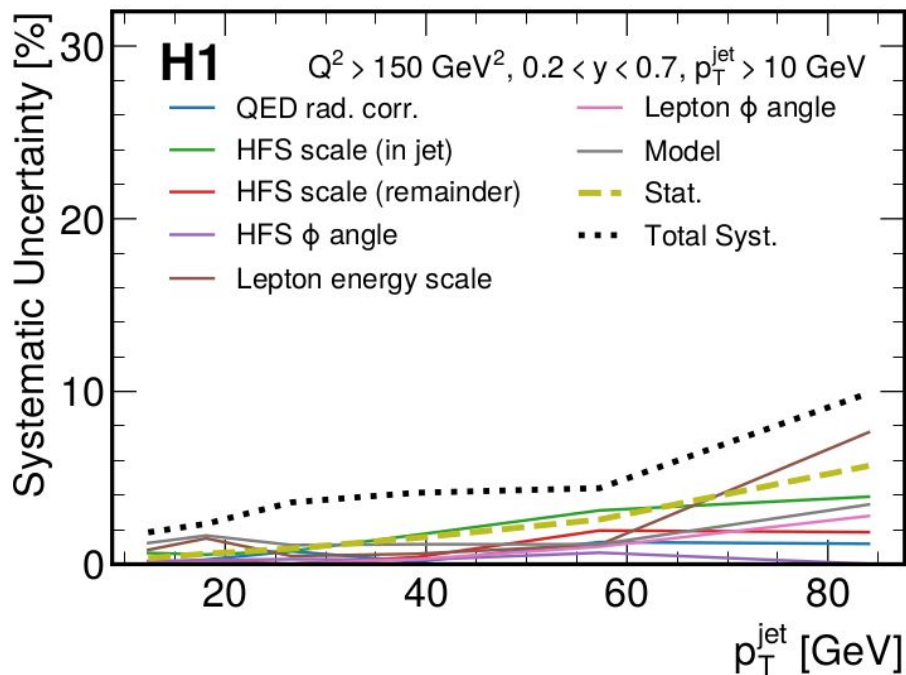


# Closure tests (Pseudo Data: Django, Response: Rapgap)

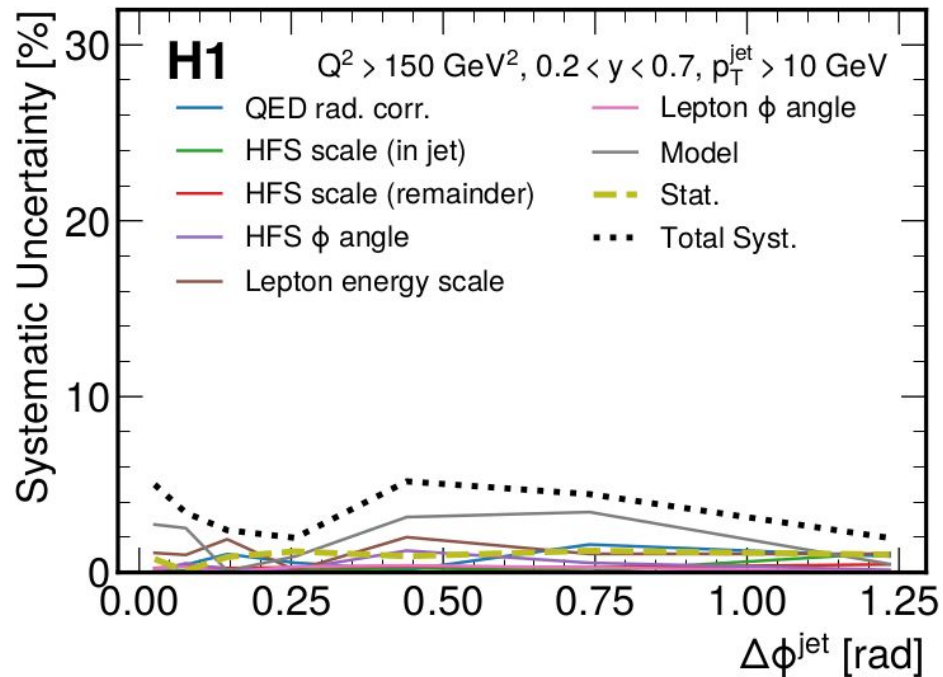
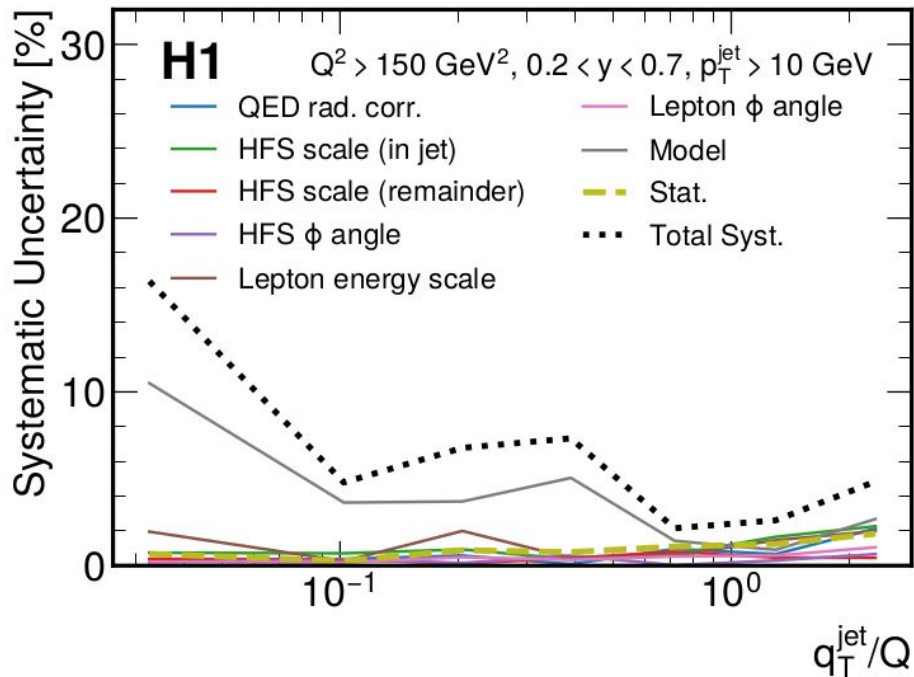




# Systematic uncertainties



# Systematic uncertainties



Open Access

## Measurement of Lepton-Jet Correlation in Deep-Inelastic Scattering with the H1 Detector Using Machine Learning for Unfolding

V. Andreev *et al.* (H1 Collaboration)

Phys. Rev. Lett. **128**, 132002 – Published 31 March 2022

Article

References

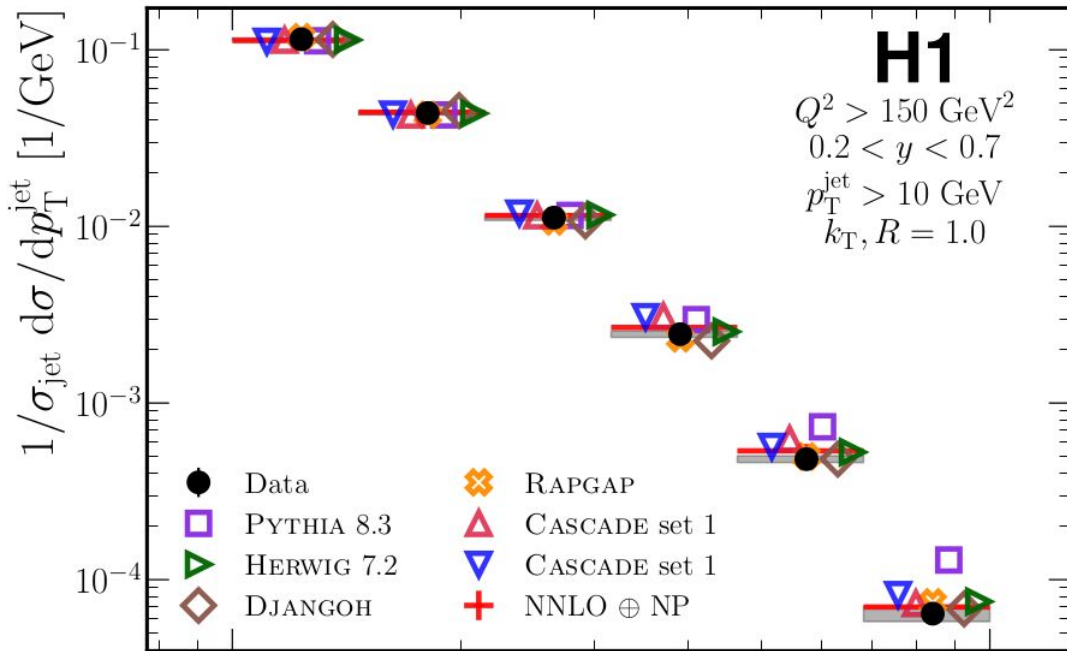
No Citing Articles

Supplemental Material

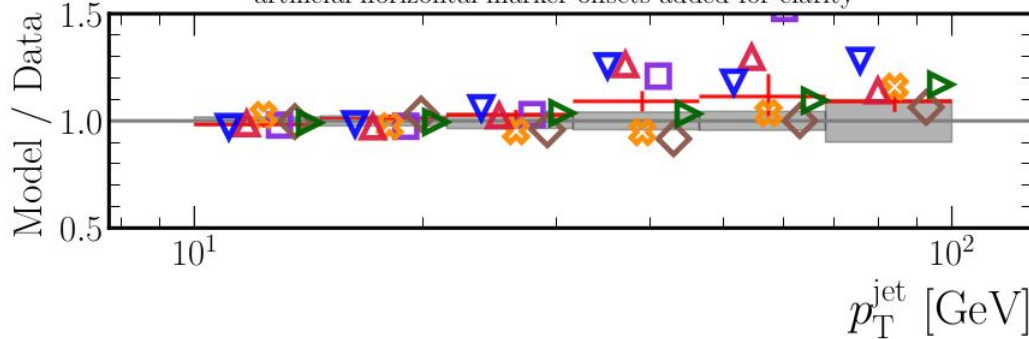
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Export Citation

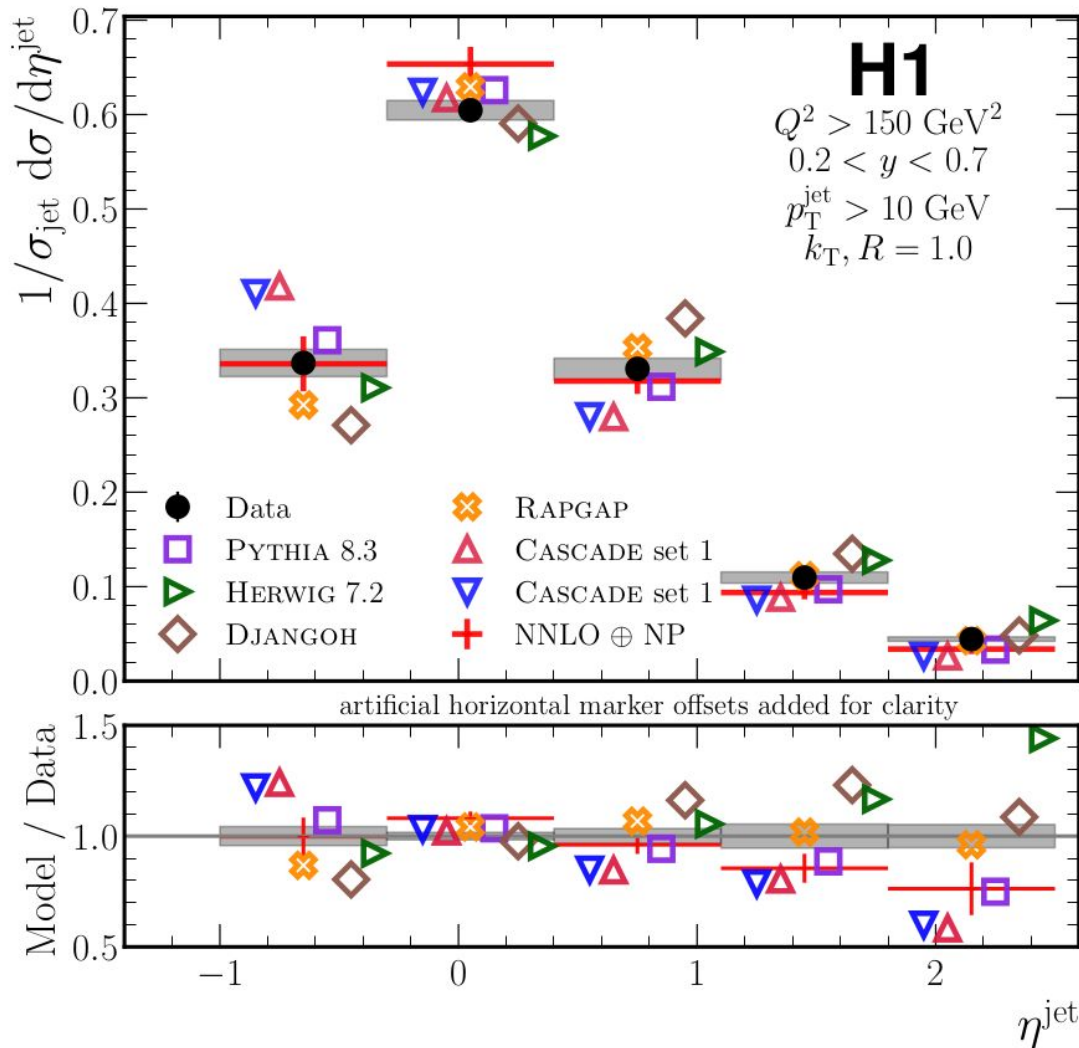


artificial horizontal marker offsets added for clarity



## Jet transverse momentum

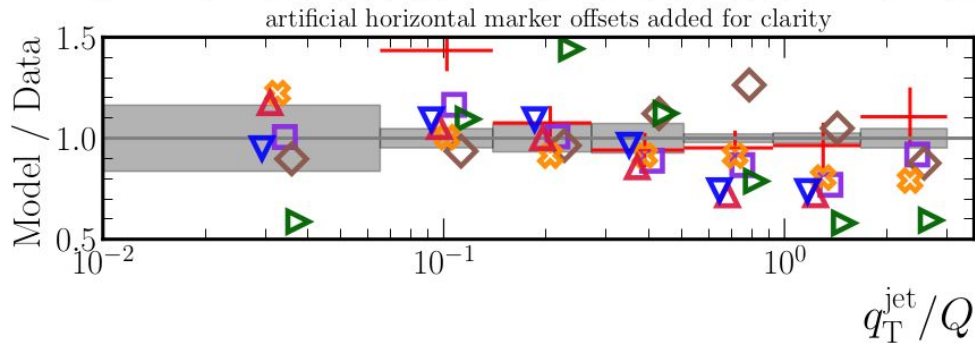
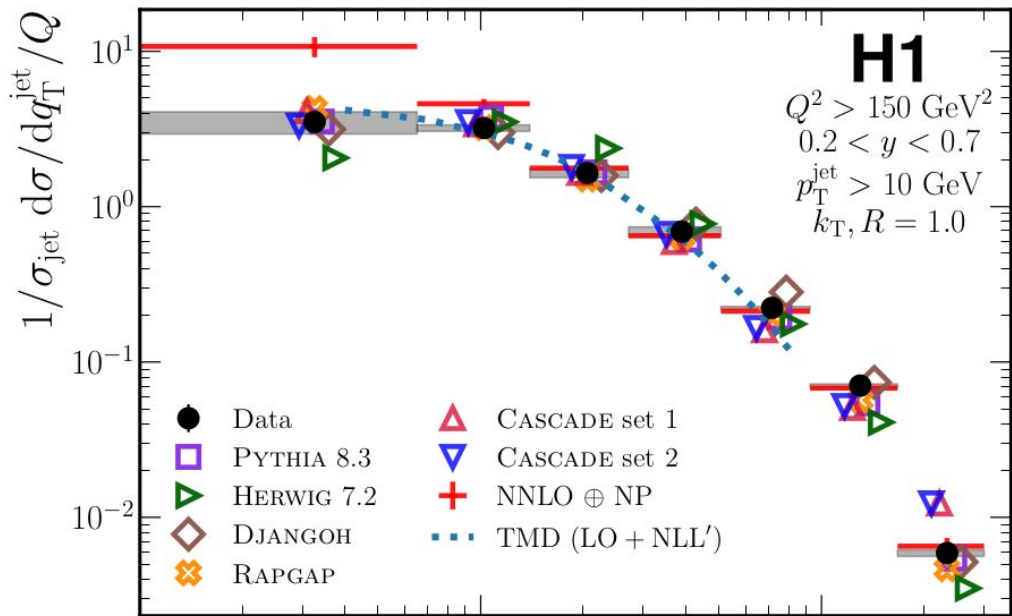
Well described by NNLO calculation, and some MCs like Herwig and Djangoh



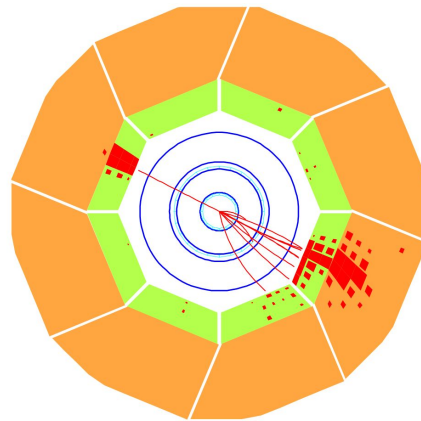
## Jet pseudorapidity

Not well described at large pseudorapidity by NNLO, missing higher-order terms.

Well described by Rapgap



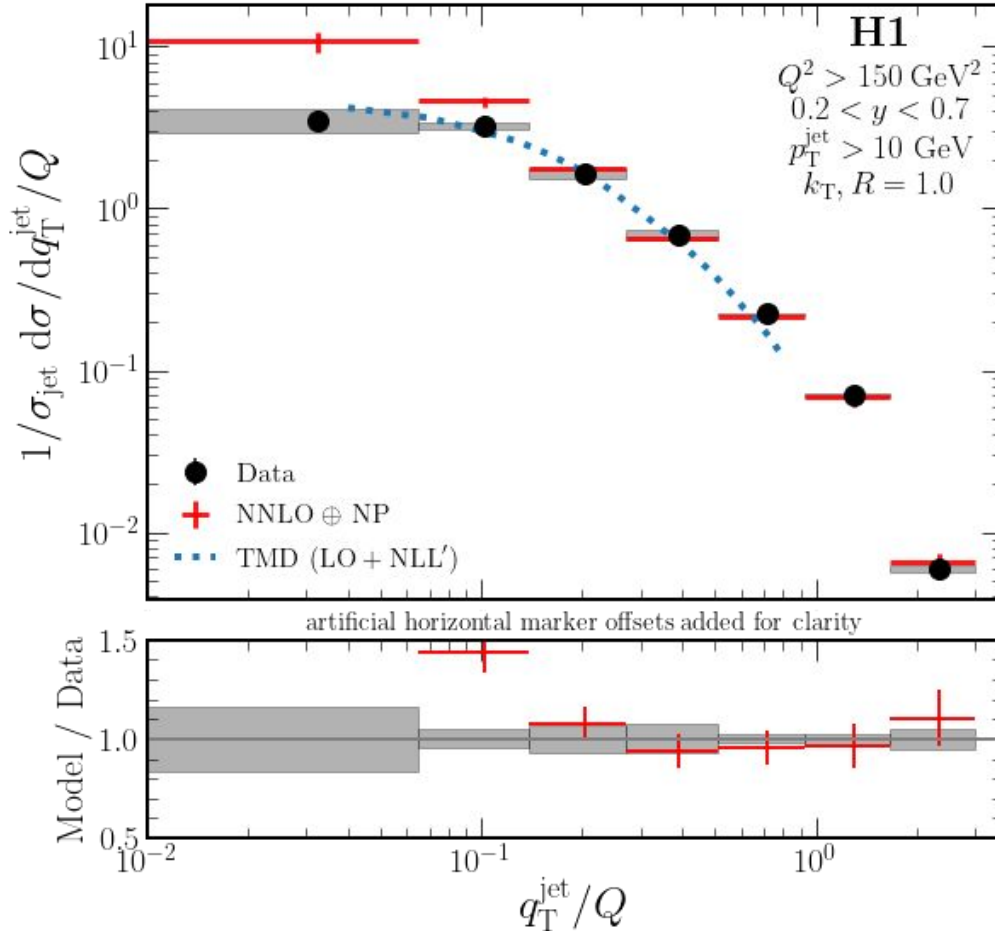
**Lepton-jet momentum imbalance**  $q_T = |\vec{p}_T^e + \vec{p}_T^{\text{jet}}|$



**TMD calculation does a great job at low  $q_T$ ; collinear calculation does a great job at large  $q_T$ .**

**Large overlap between collinear and TMD frameworks**

# Momentum imbalance



Textbook example of “matching” between collinear and TMD frameworks

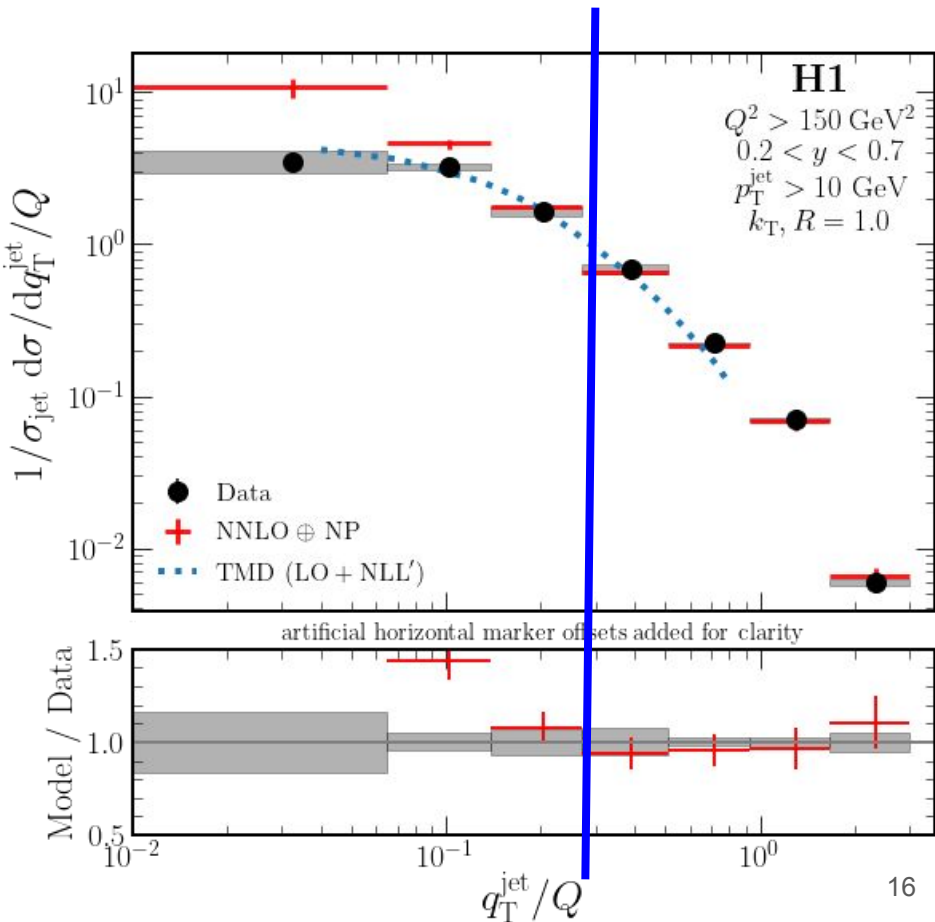
First time seen in DIS!

(not seen in fixed-target DIS)

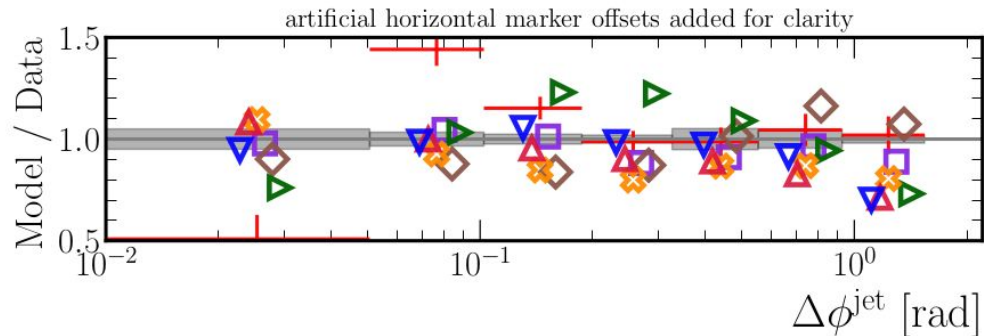
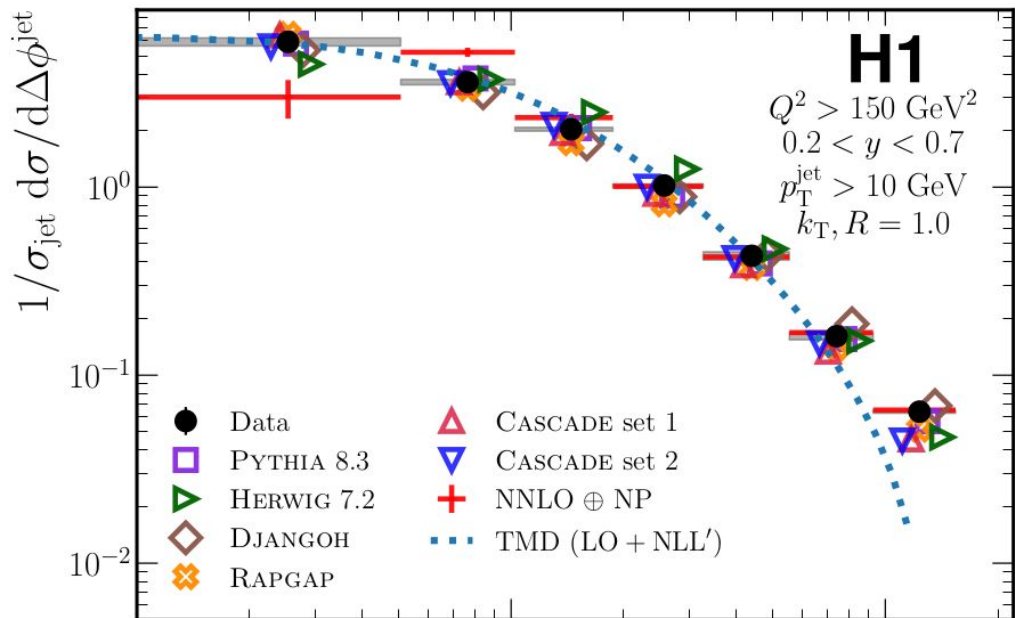
# TMD calculation, without free parameters, describes data over wide kinematic range

$$\frac{d^5\sigma(\ell p \rightarrow \ell' J)}{dy_\ell d^2k_{\ell\perp} d^2q_\perp} = \sigma_0 \int d^2k_\perp d^2\lambda_\perp x f_q(x, k_\perp, \zeta_c, \mu_F) \times H_{\text{TMD}}(Q, \mu_F) S_J(\lambda_\perp, \mu_F) \times \delta^{(2)}(q_\perp - k_\perp - \lambda_\perp).$$

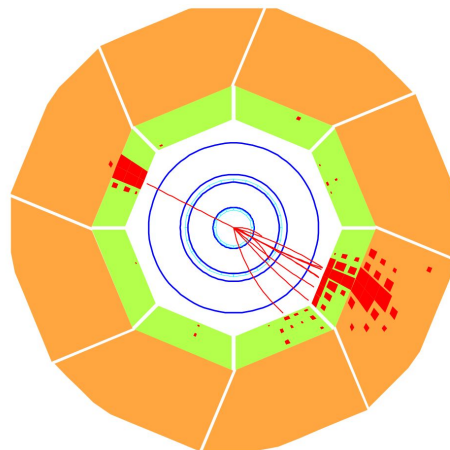
- TMD calculations by F. Yuan and Z. Kang, TMD PDFs and soft factors extracted from low  $Q^2$  DIS and DY data. Sun et al. [arXiv:1406.3073](https://arxiv.org/abs/1406.3073)







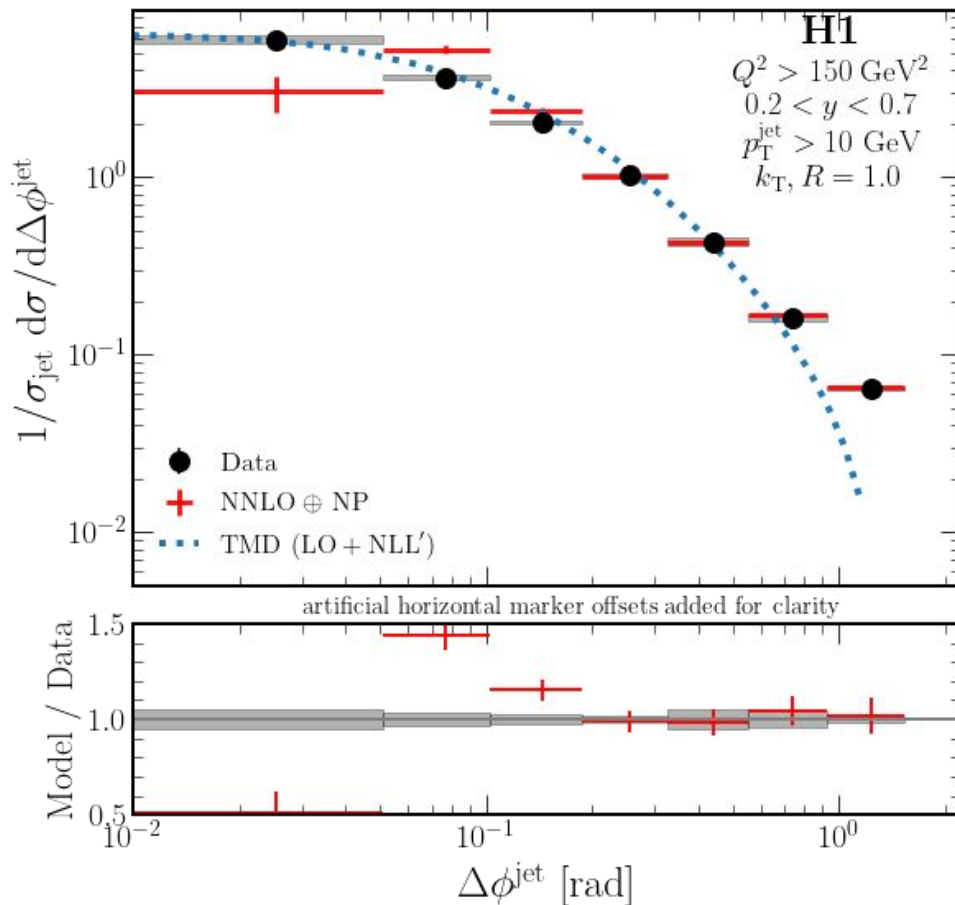
# Lepton-jet azimuthal correlations



**TMD calculation does a great job at low  $q_T$ ; collinear calculation does a great job at large  $q_T$ .**

**Large overlap between collinear and TMD frameworks**

# Azimuthal correlation



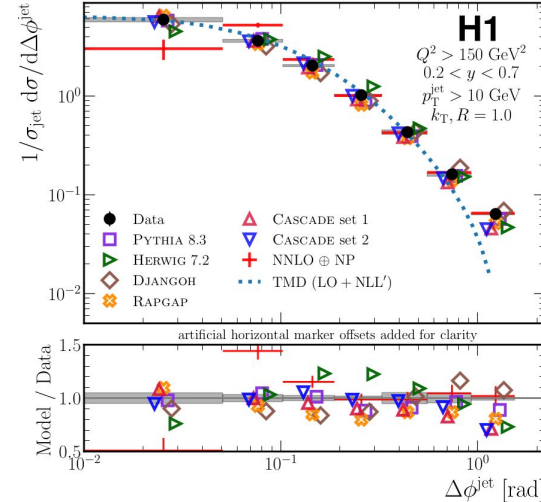
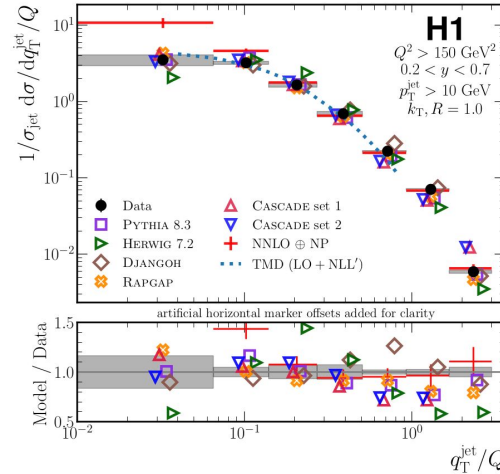
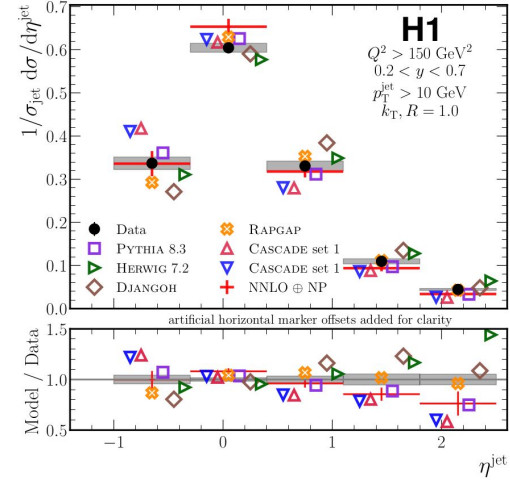
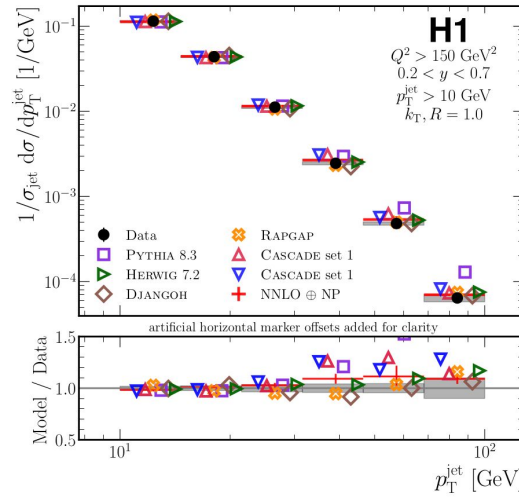
Textbook example of “matching” between collinear and TMD frameworks

**First time seen in DIS!**

**(not seen in fixed-target DIS)**

Omnifold allowed us to do a simultaneous, unbinned “unfolding”

First-ever measurement that uses machine-learning to correct for detector effects.



# Correlation matrix

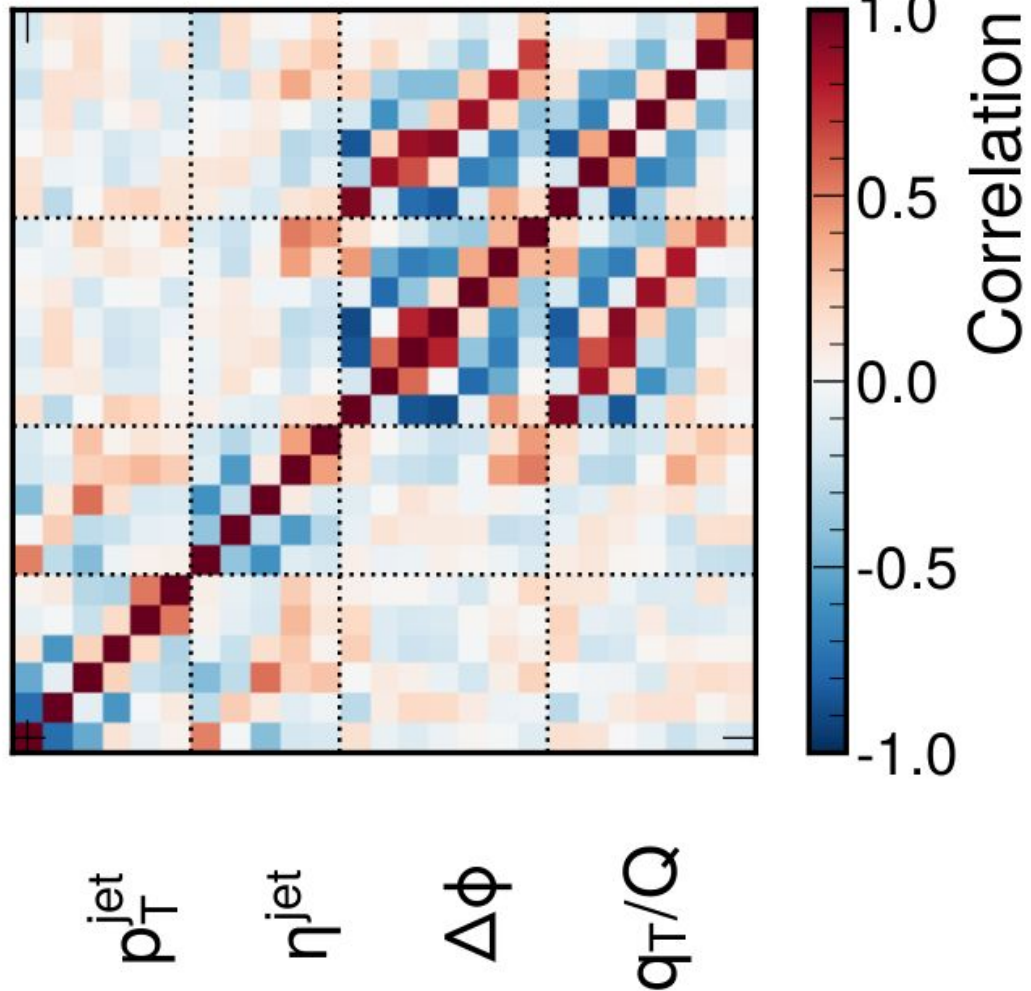
- Simultaneous Unfolding of these observables
- Unbinned (binned here for reference)

$q_T/Q$

$\Delta\phi$

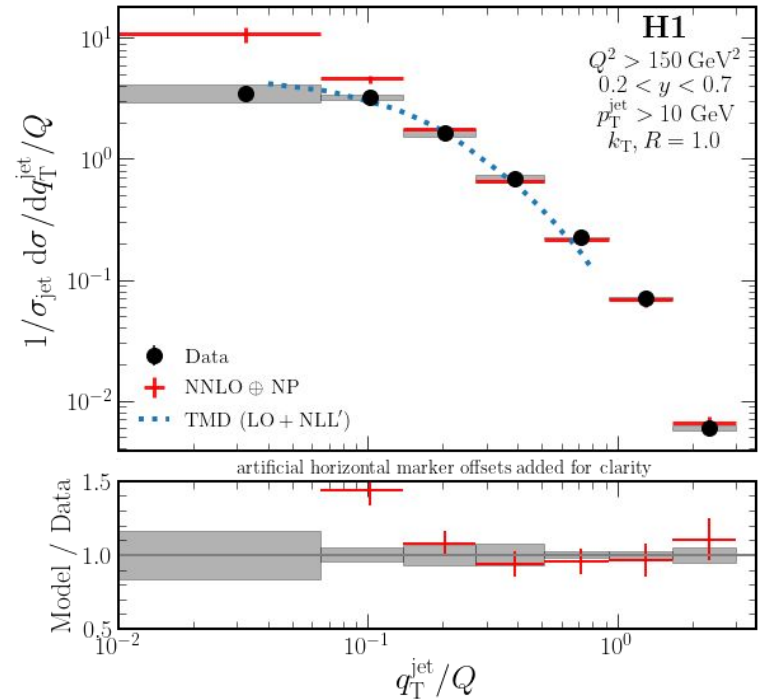
$\eta^{\text{jet}}$

$p_T^{\text{jet}}$



# Summary

- New measurement of lepton jet momentum and azimuthal imbalance in DIS, which provide **a new way to constrain TMD PDFs and their evolution**
- Pure TMD calculation does a great job at low  $q_T$ ;  
Pure collinear calculation does a great job at large  $q_T$ .  
Large overlap. Data can **constrain matching between TMD and collinear frameworks**
- **First-ever measurement that uses machine-learning to correct for detector effects.** (using Omnifold method)
- This is the first measurement in a series of studies that aim at creating a **pathfinder program for the future EIC**

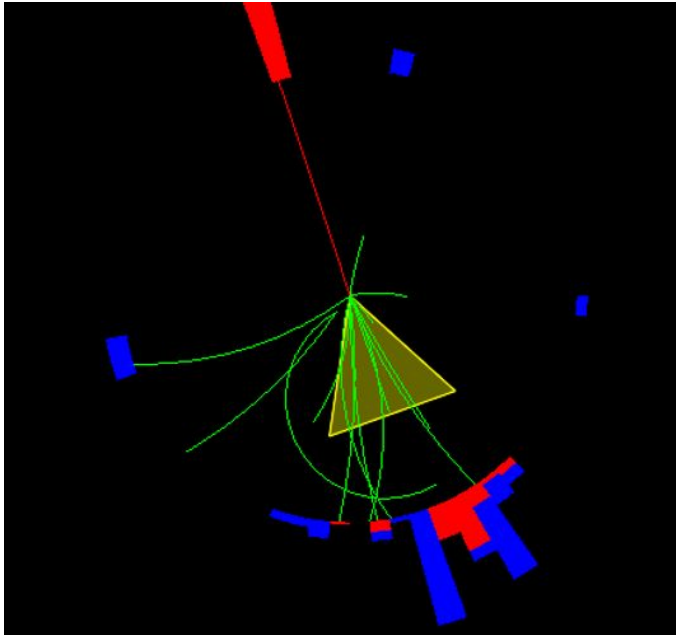


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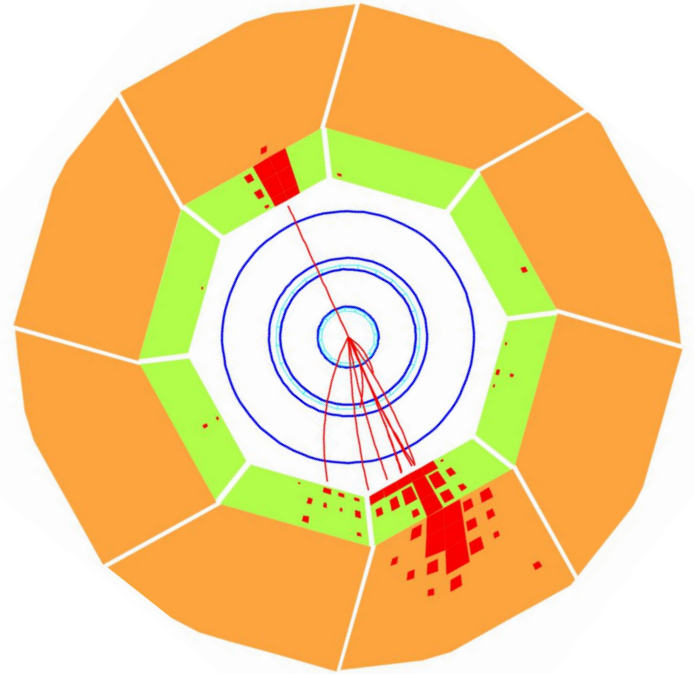


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**EIC**

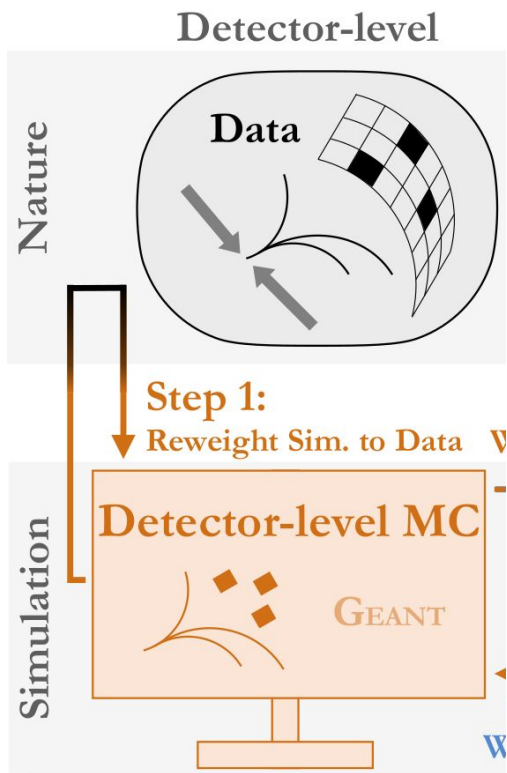


**H1@HERA**



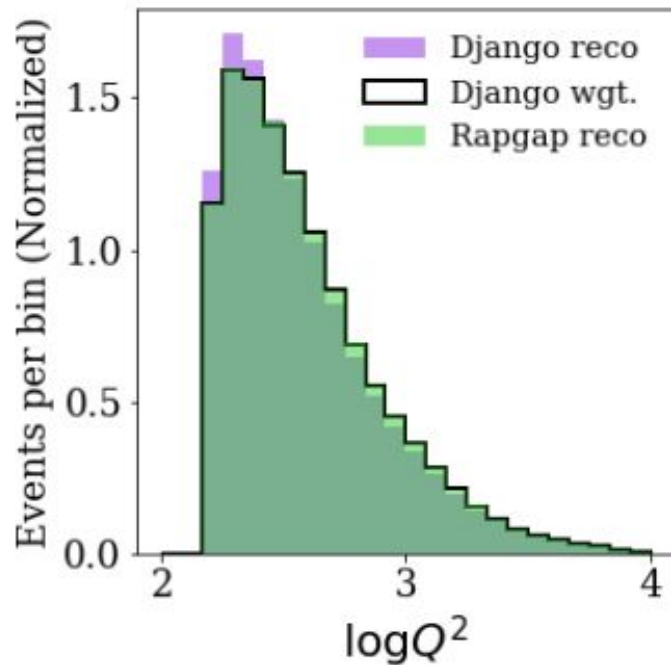
backup

# Reweighting the reco-level distributions



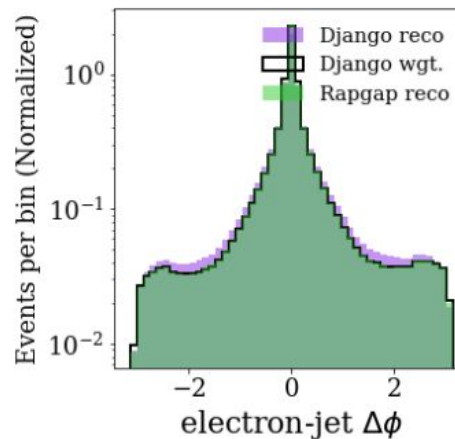
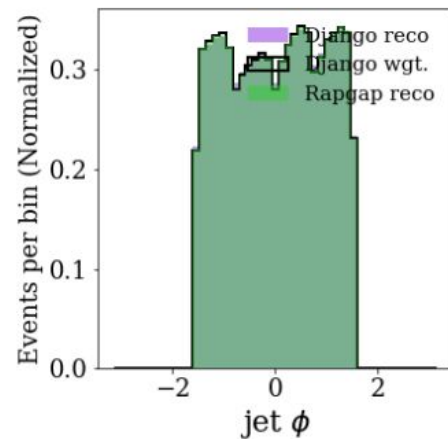
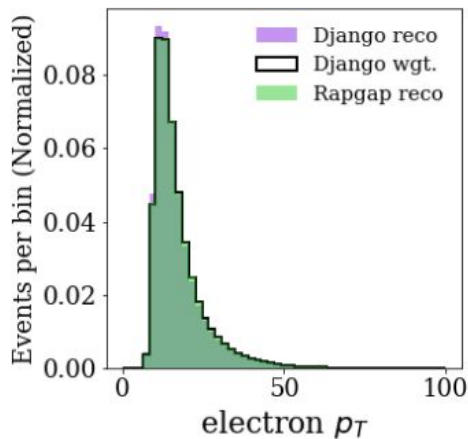
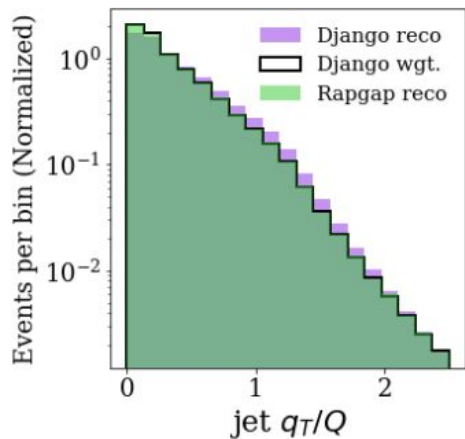
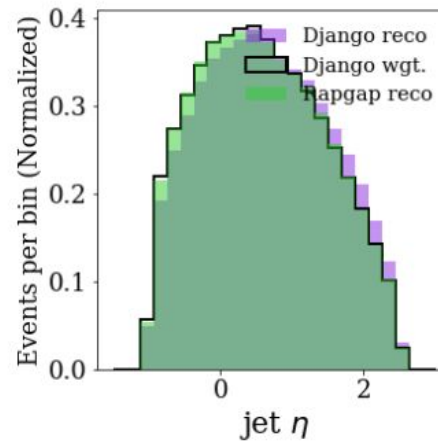
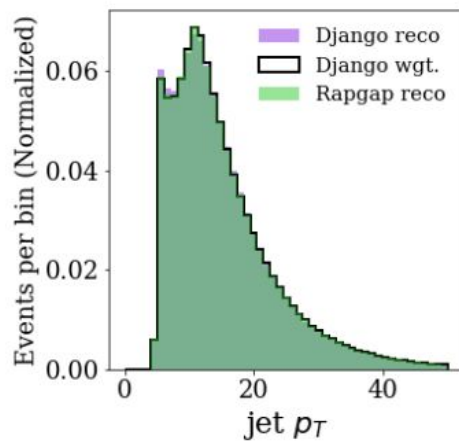
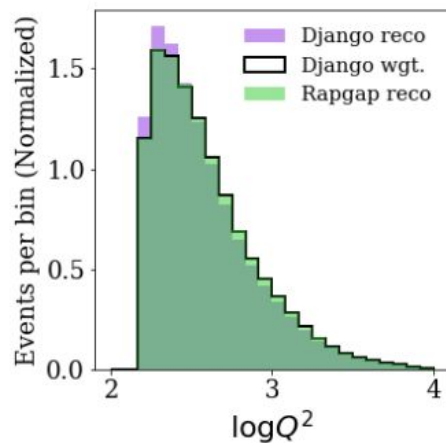
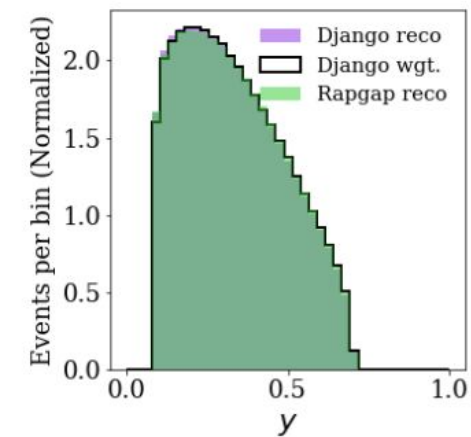
We use simple fully connected networks with a few hidden layers.

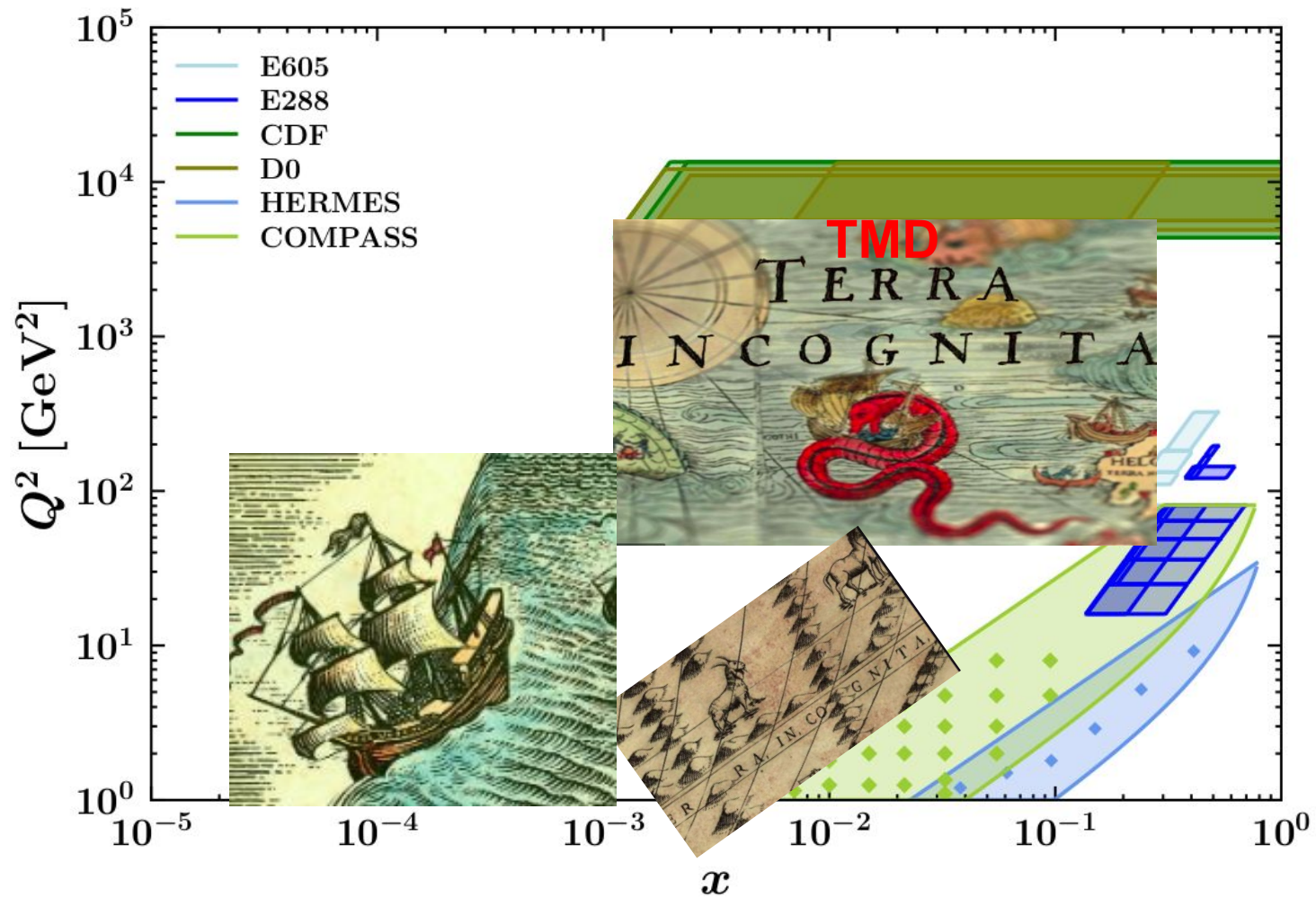
The distribution is binned for illustration, but the reweighting is unbinned.





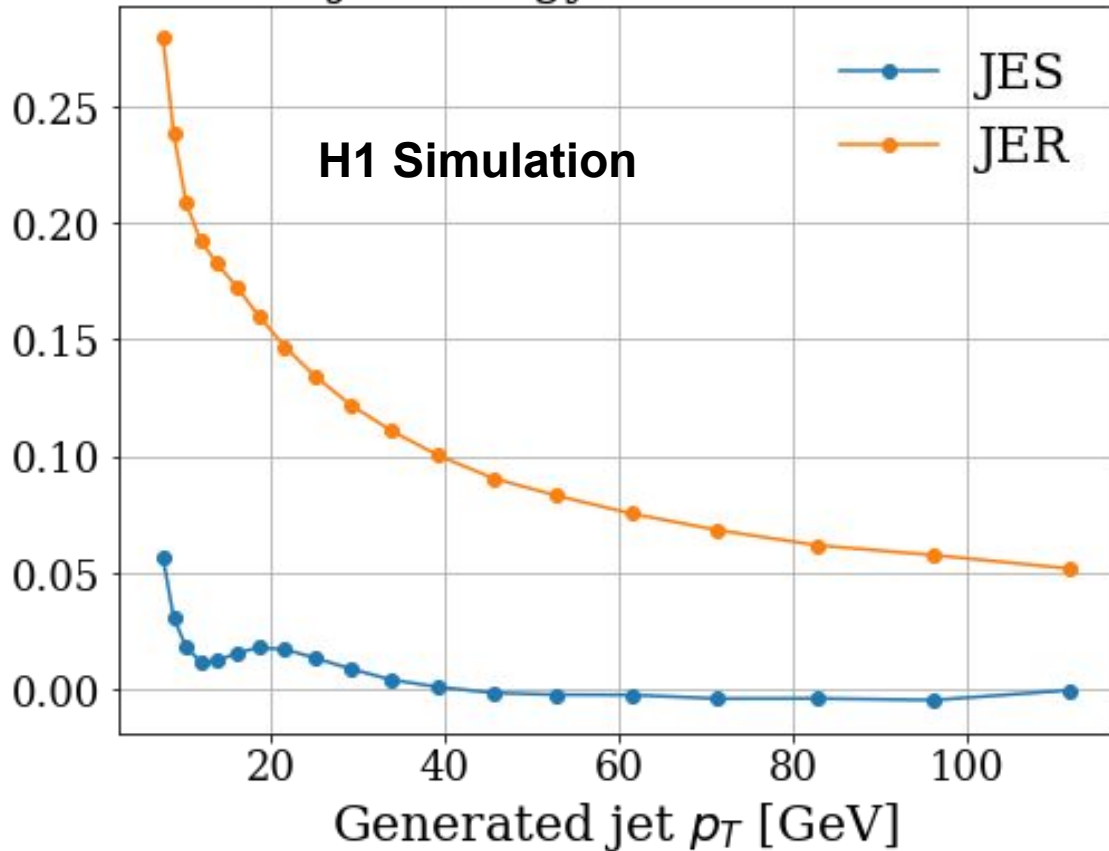
# All these distributions are simultaneously reweighted



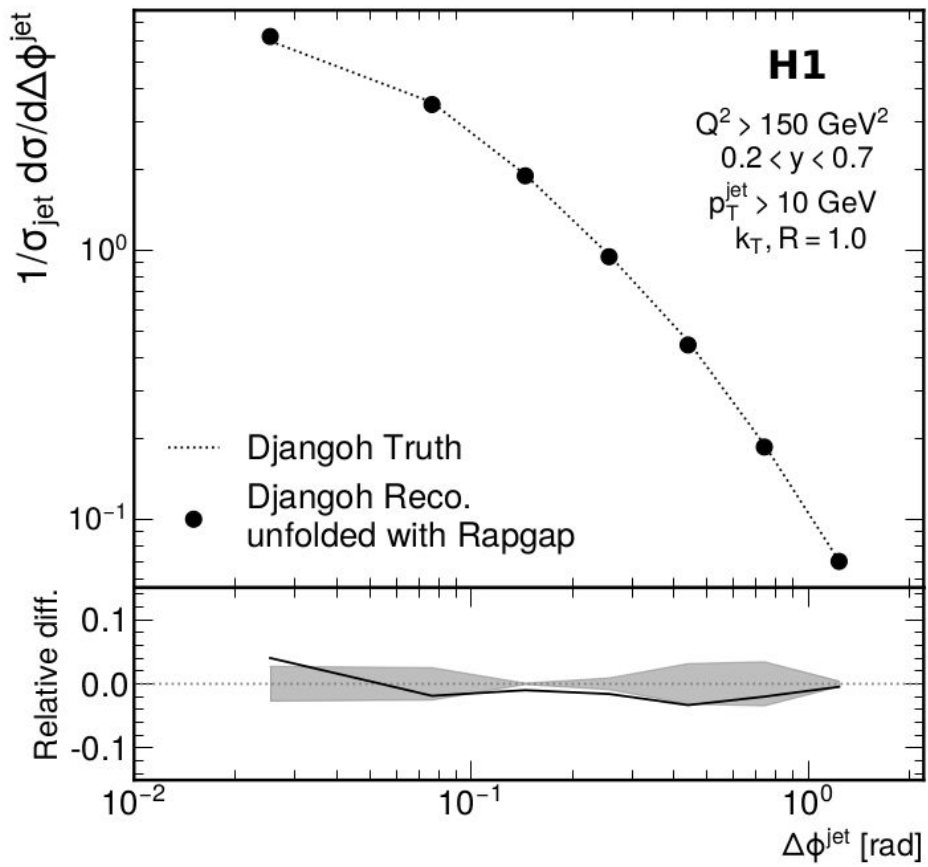
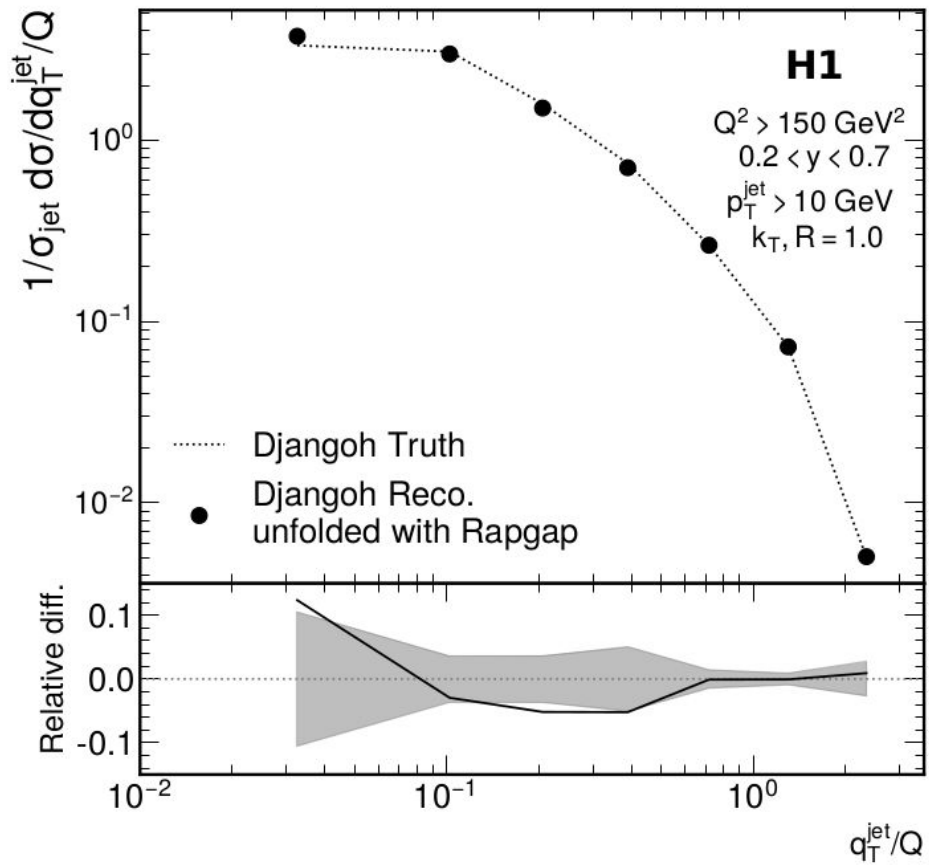


# Jet performance (energy flow reconstruction)

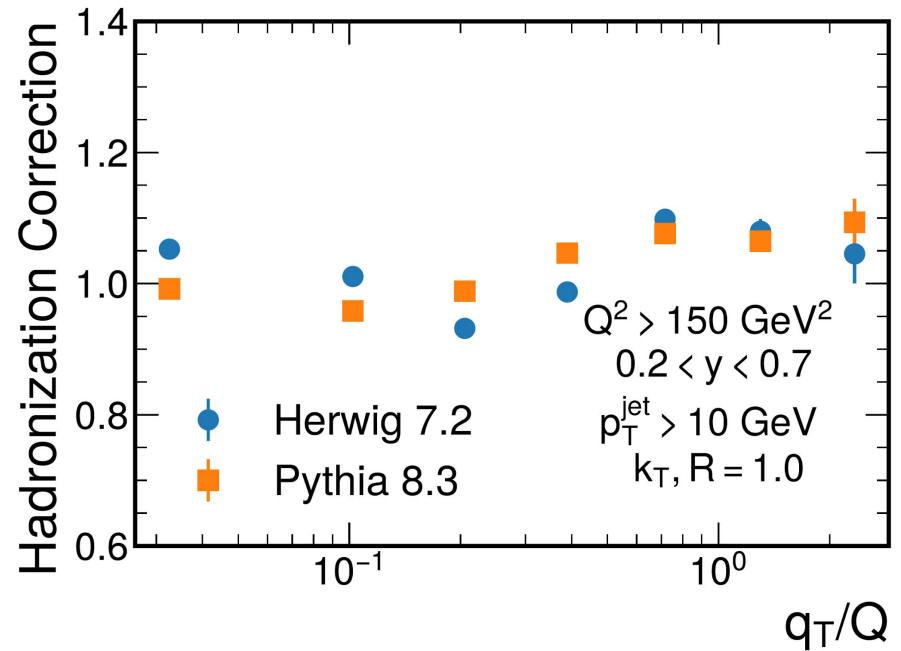
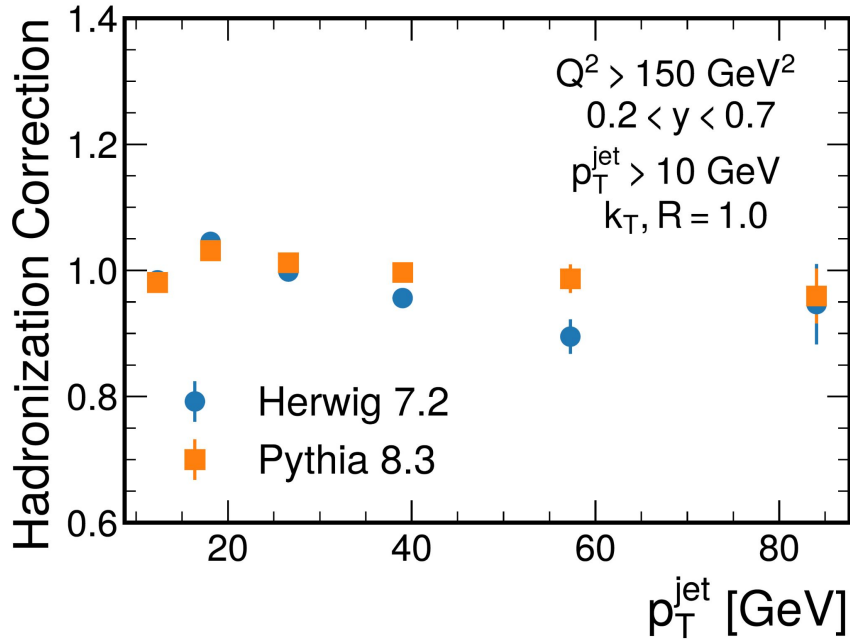
Relative jet-energy scale and resolution



# Closure tests (Pseudo Data: Django, Response: Rapgap)



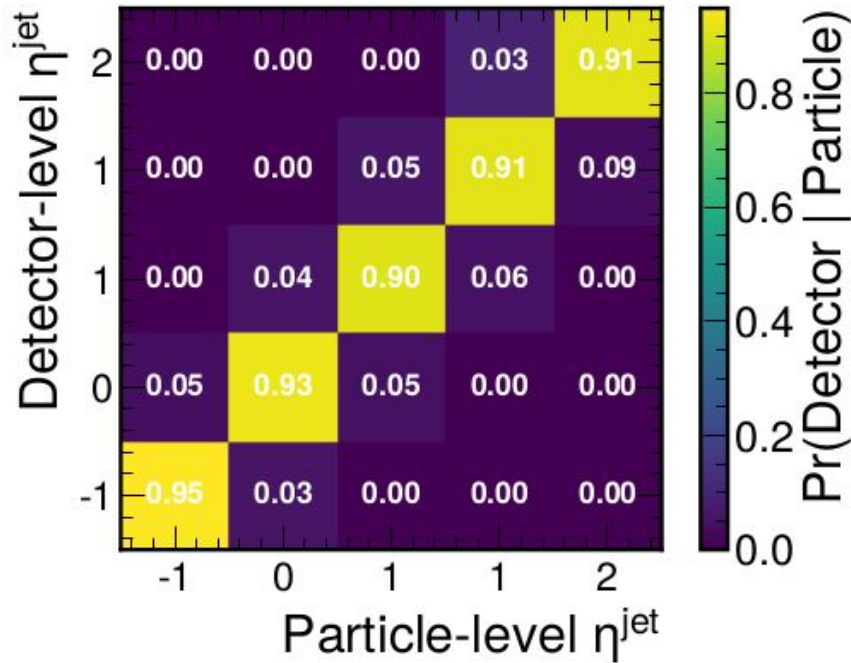
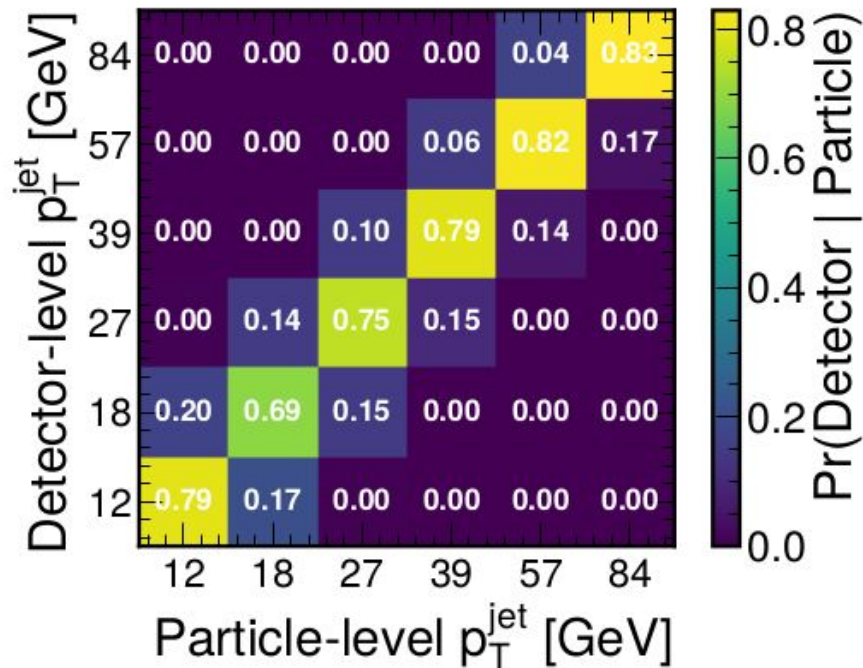
# Hadronization corrections (applied to NNLO calculation)



Small, and consistent with Pythia8 and Herwig despite different models of hadronization

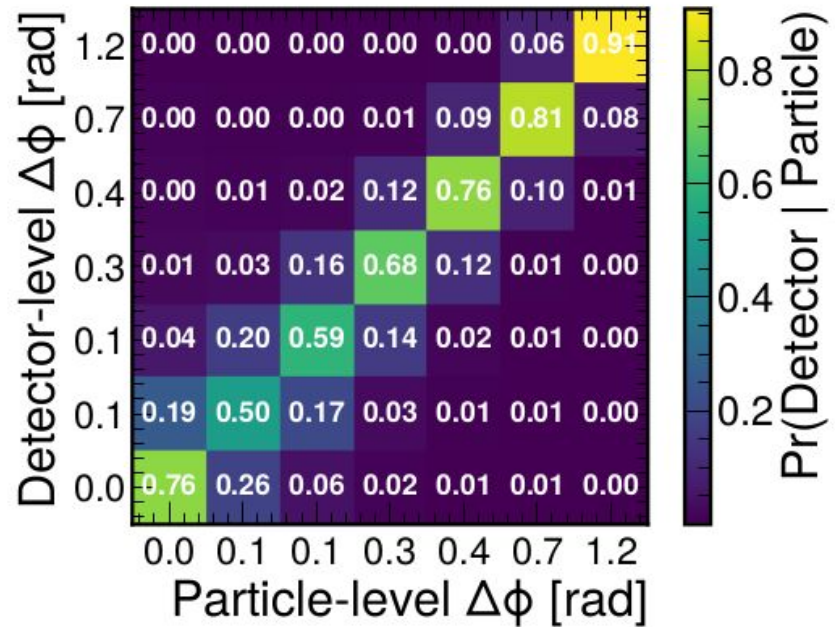
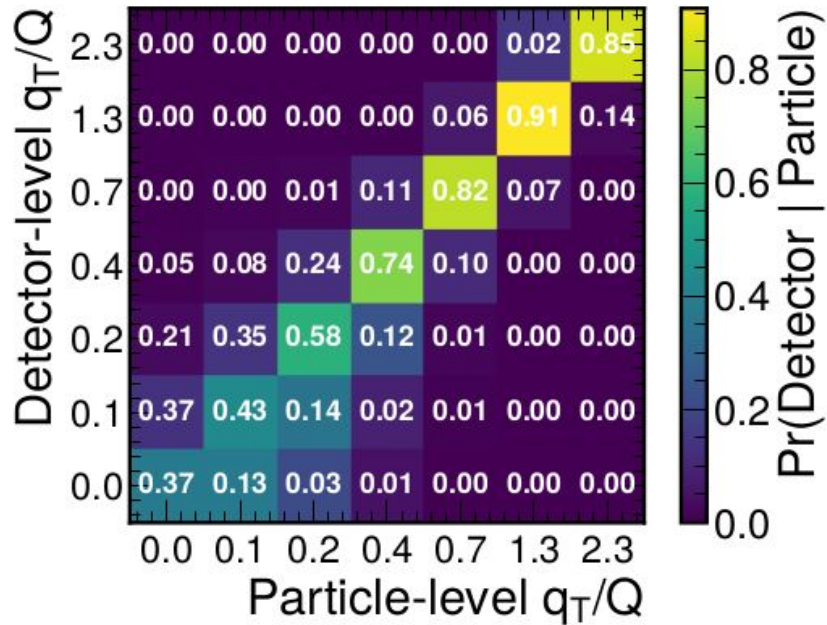
## Response matrices

(not actually used as our results are unbinned, but just for reference)



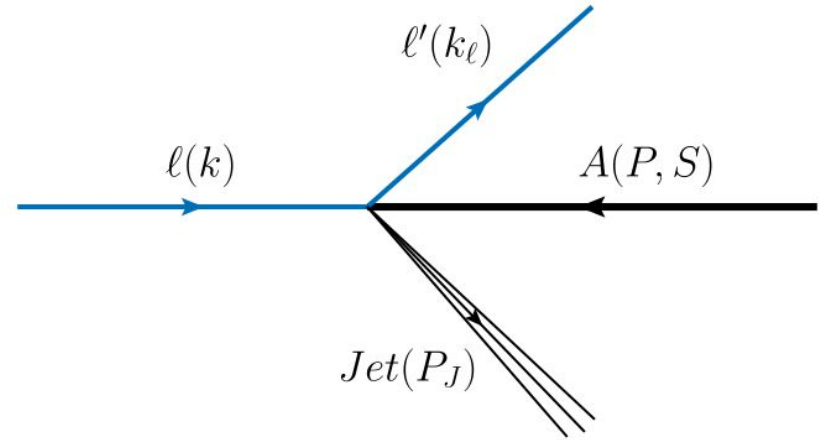
## Response matrices

(not actually used as our results are unbinned, but just for reference)



Lepton-jet imbalance  $q_T = |\vec{k}_{l\perp} + \vec{p}_{\perp}^j|$   
 In Born-level configuration  
 Probes quark TMD PDFs

Liu et al. PRL. 122, 192003 (2019)



$$\frac{d^5 \sigma(\ell p \rightarrow \ell' J)}{dy_\ell d^2 k_{\ell\perp} d^2 q_\perp} = \sigma_0 \int d^2 k_\perp d^2 \lambda_\perp x f_q(x, k_\perp, \zeta_c, \mu_F)$$

$$\times H_{\text{TMD}}(Q, \mu_F) S_J(\lambda_\perp, \mu_F)$$

$$\times \delta^{(2)}(q_\perp - k_\perp - \lambda_\perp).$$



# Evolution: Endgame



Jefferson Lab

