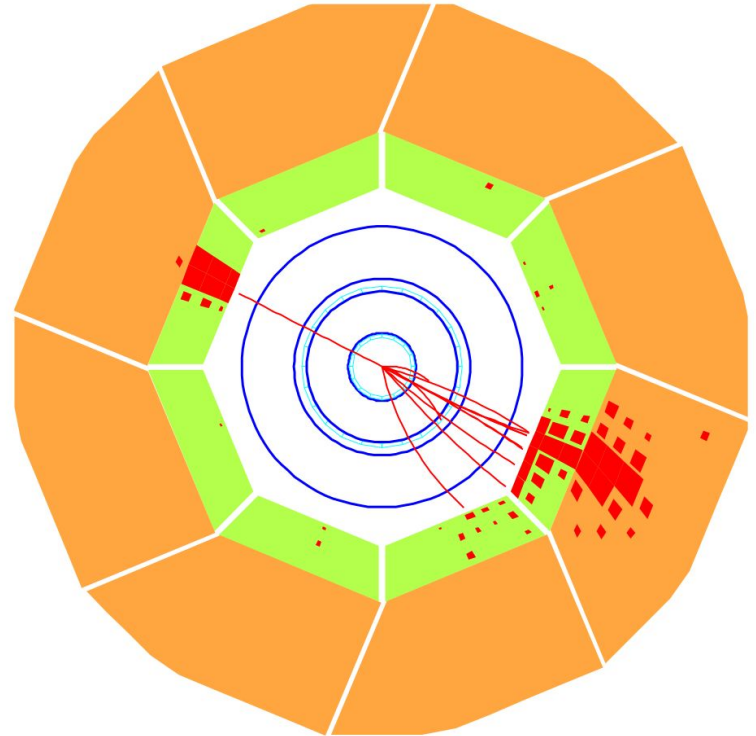


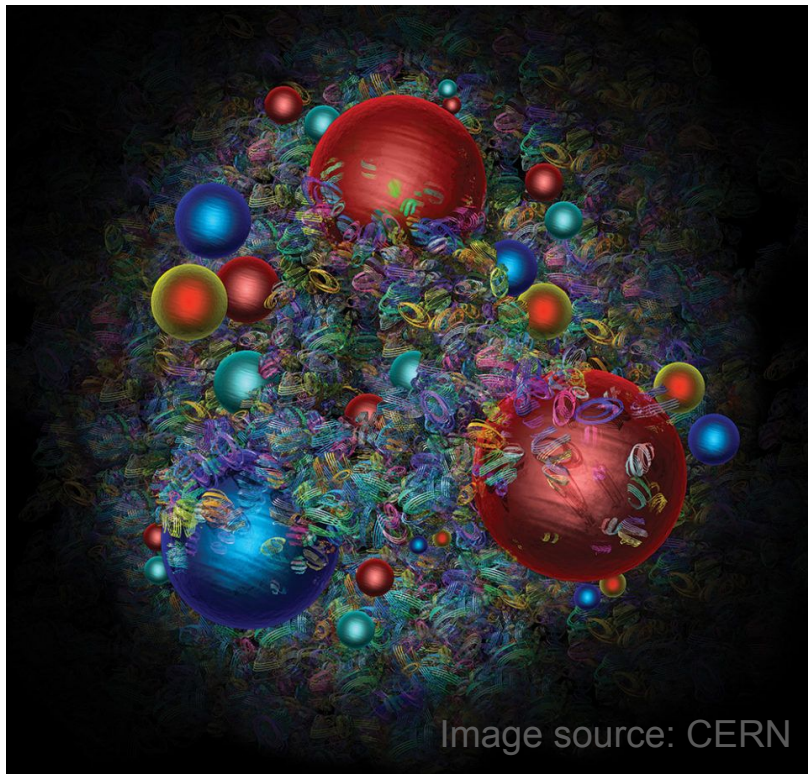
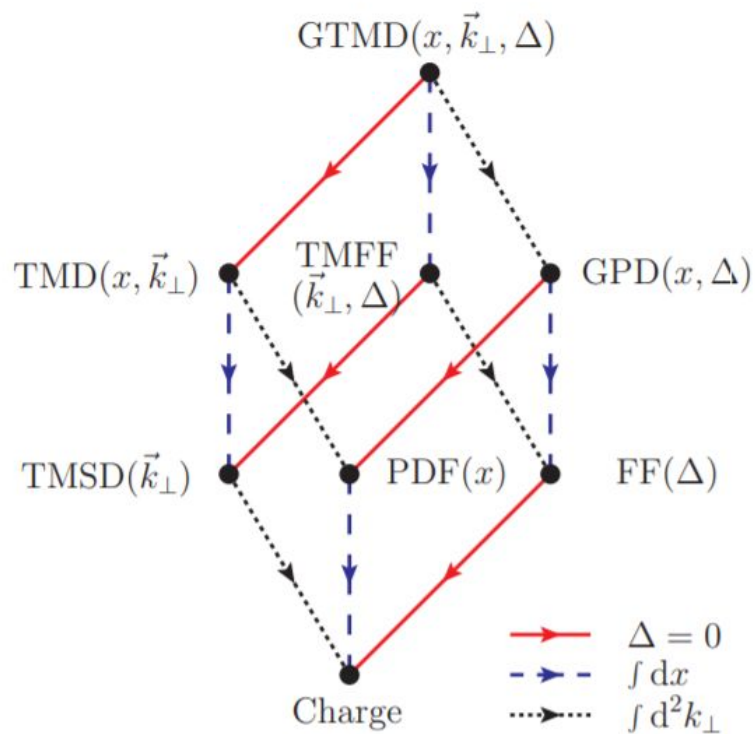
# Machine learning-assisted measurement of multi-differential lepton-jet correlations in deep-inelastic scattering with the H1 detector

Miguel Arratia

**UC RIVERSIDE**



# Towards a **quantum tomography** of the proton (and nuclei)

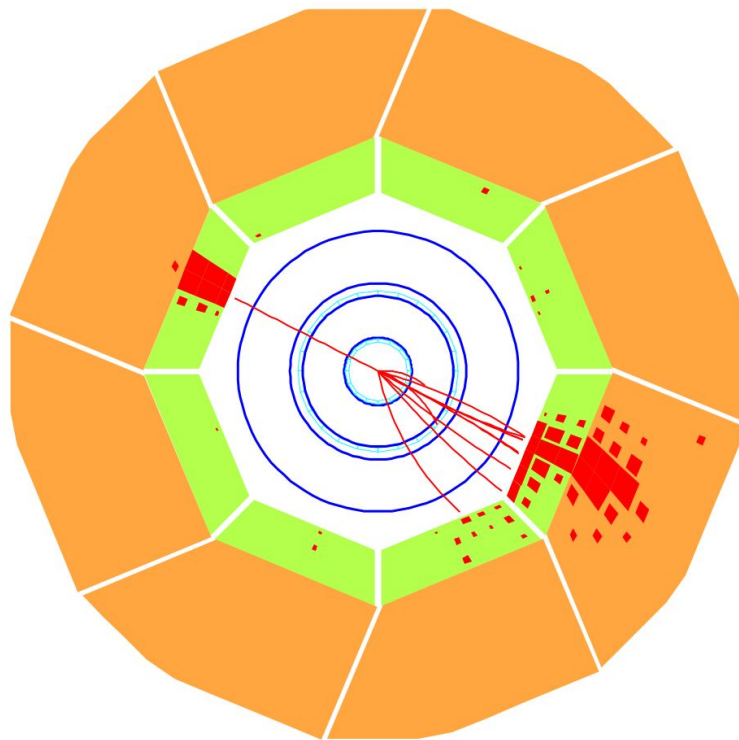
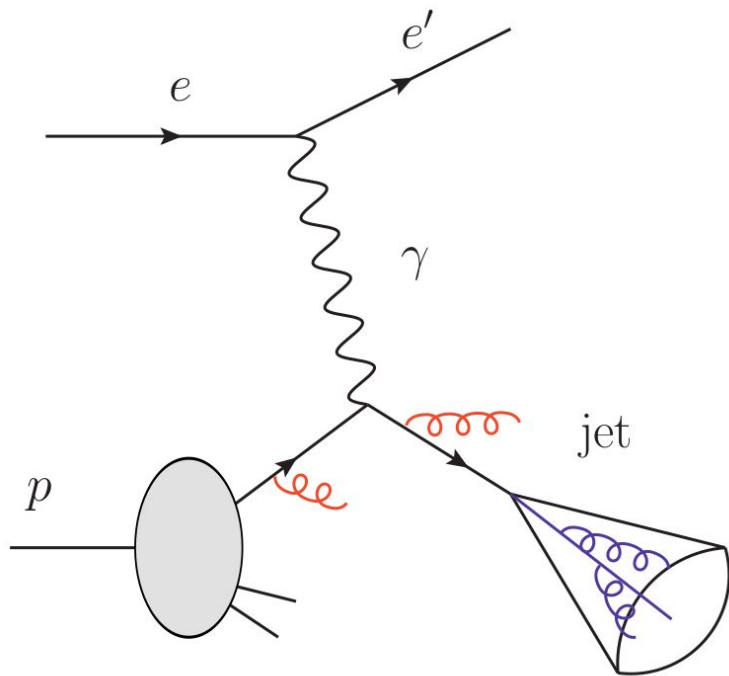


# A new channel to probe for quark TMDs and evolution

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

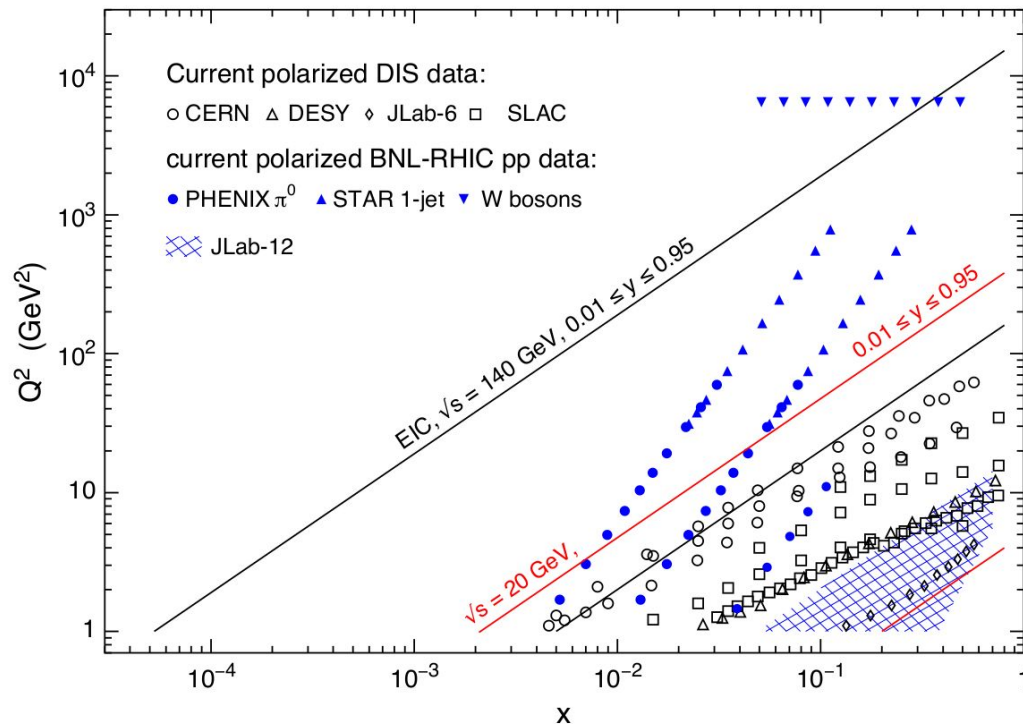
Gutierrez et al. PRL. 121, 162001 (2018)

$$q_T = |\vec{k}_{l\perp} + \vec{p}_{\perp}^j|$$



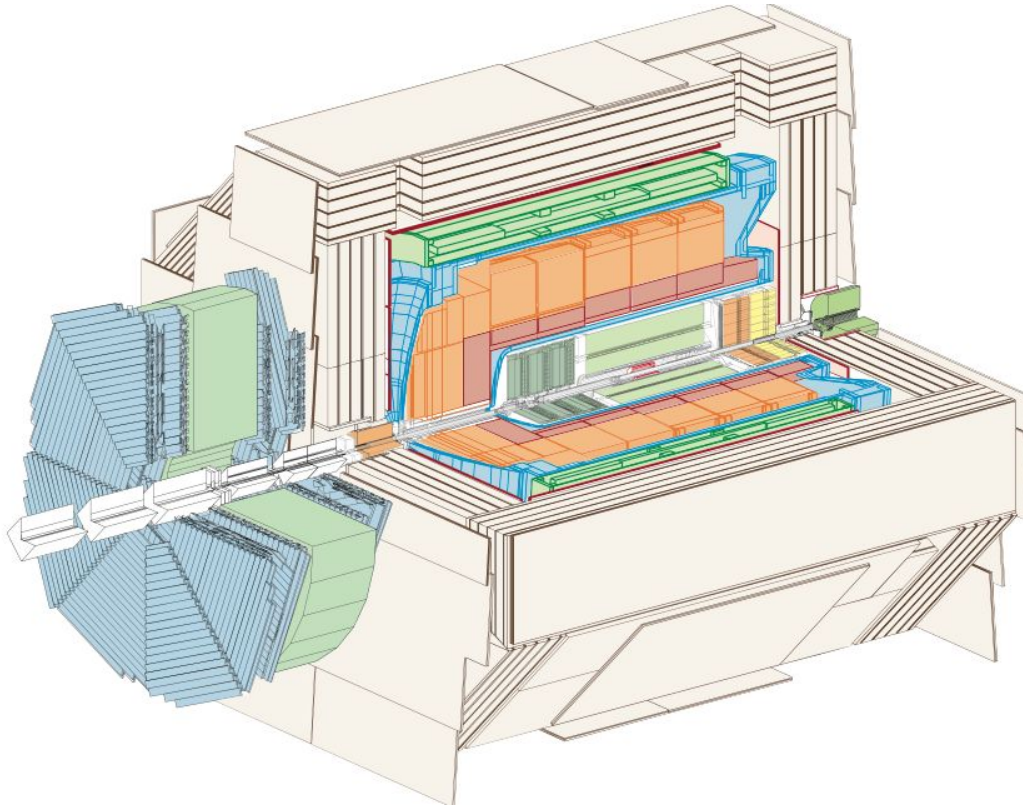
# Constraining TMD evolution

H1 can bridge low  $Q^2$  DIS from fixed-target exp. and high  $Q^2$  Drell-Yan at colliders.  
Fixing open issues of TMD factorization & universality



**Unpolarized TMD DIS measurements  
Important baseline for EIC**

# The H1 experiment at HERA



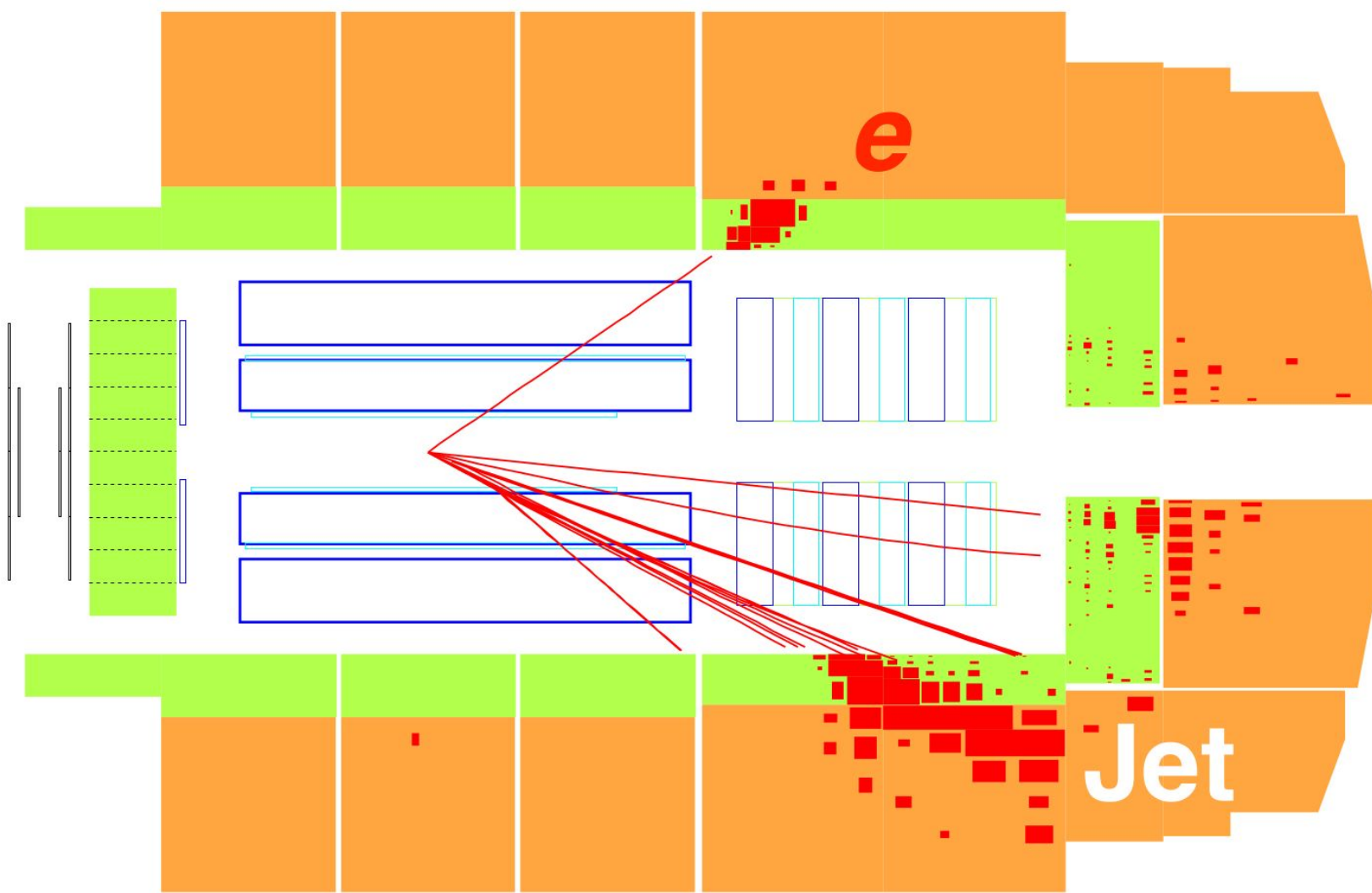
- Tracking system  
(silicon tracker, jet chambers,  
proportional chambers)
- LAr calorimeter (em/had)
- Scintillating fiber calorimeter

**Both combined using  
an energy flow algorithm**

**1% Jet energy scale**

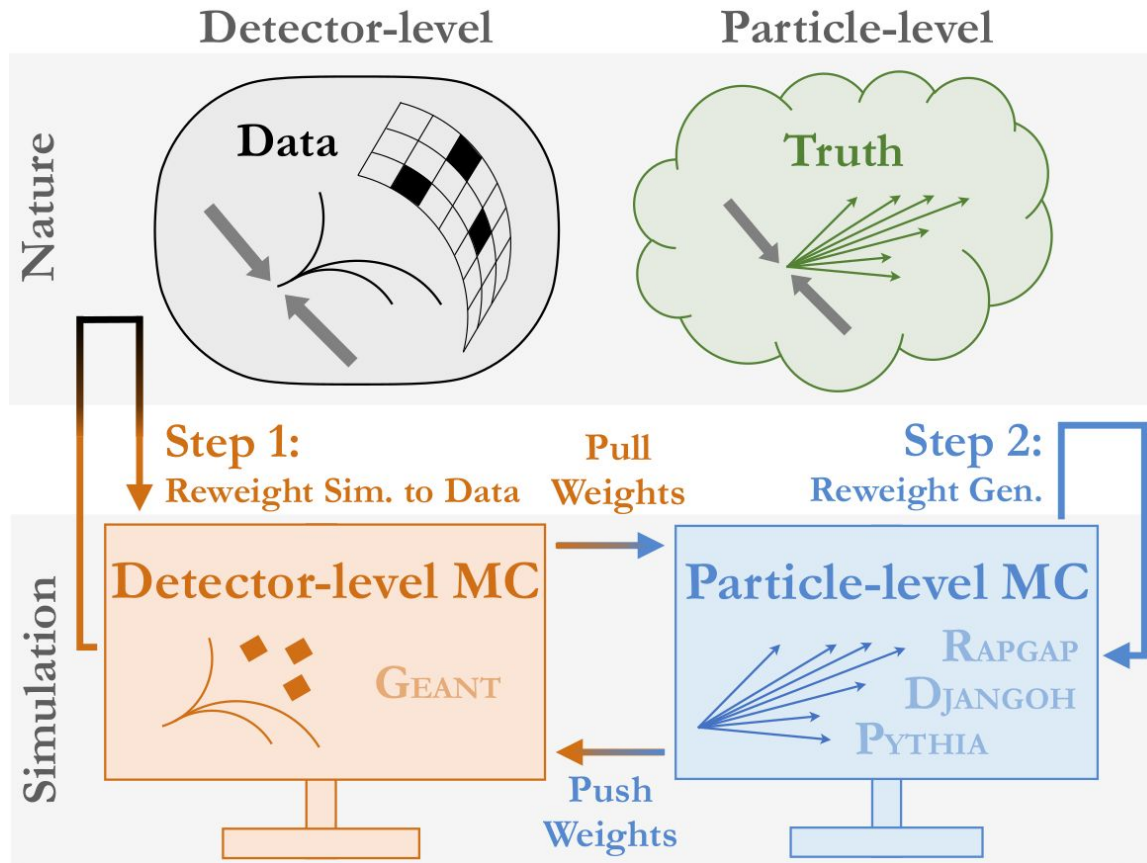
0.5-1% lepton energy scale





# Unfolding with Omnifold (via machine-learning).

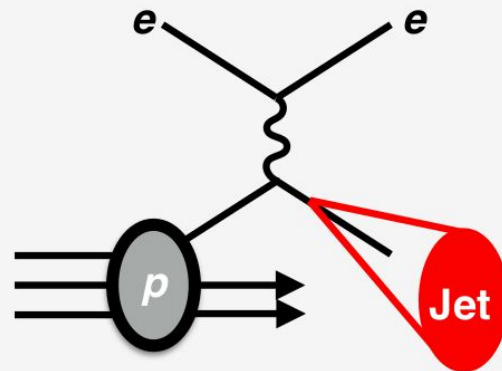
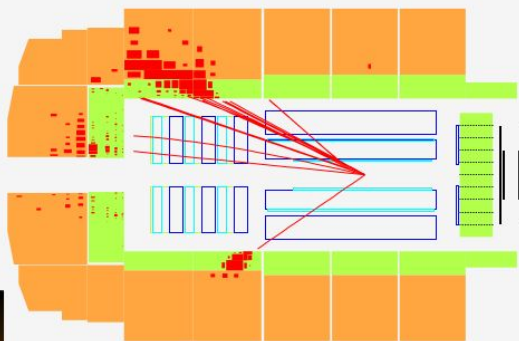
Andreassen et al. PRL **124**, 182001 (2020)



Detector-level

Particle-level

Nature



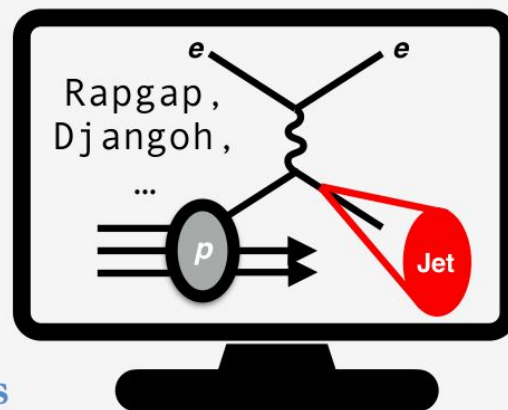
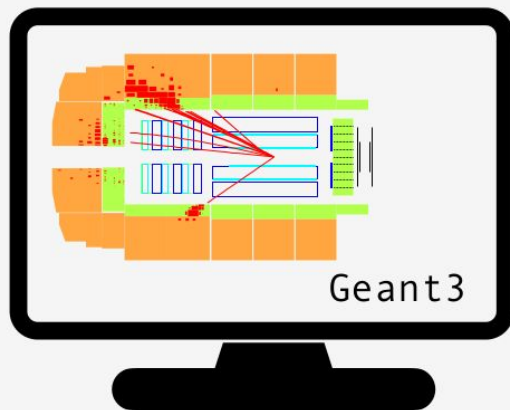
Step 1:

Reweight Sim. to Data

Pull  
Weights

Step 2:  
Reweight Gen.

Simulation



Push  
Weights

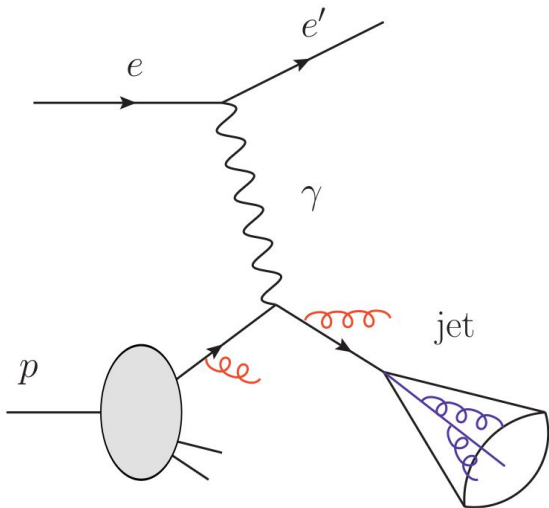
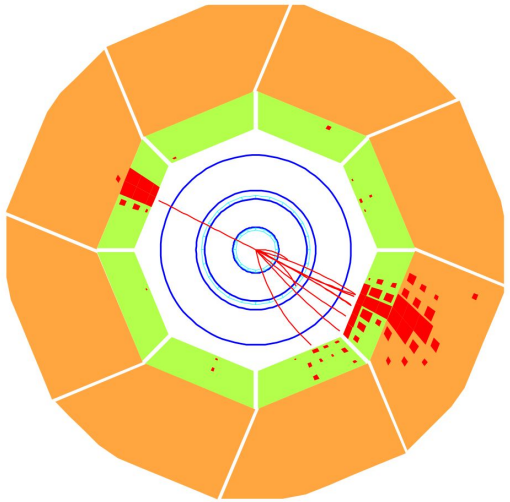


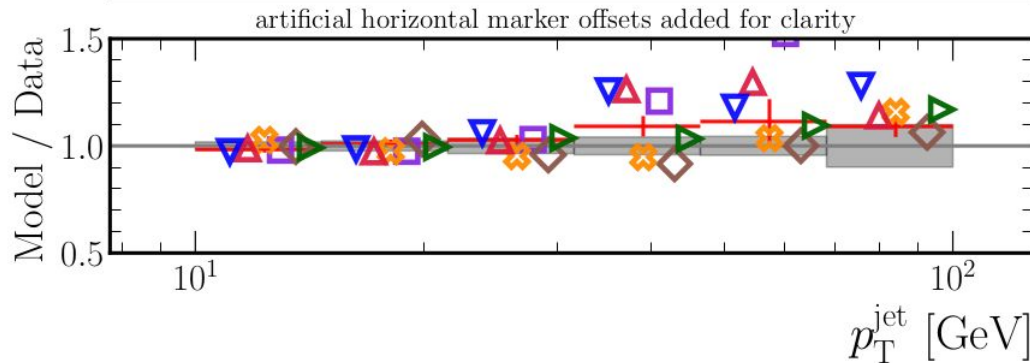
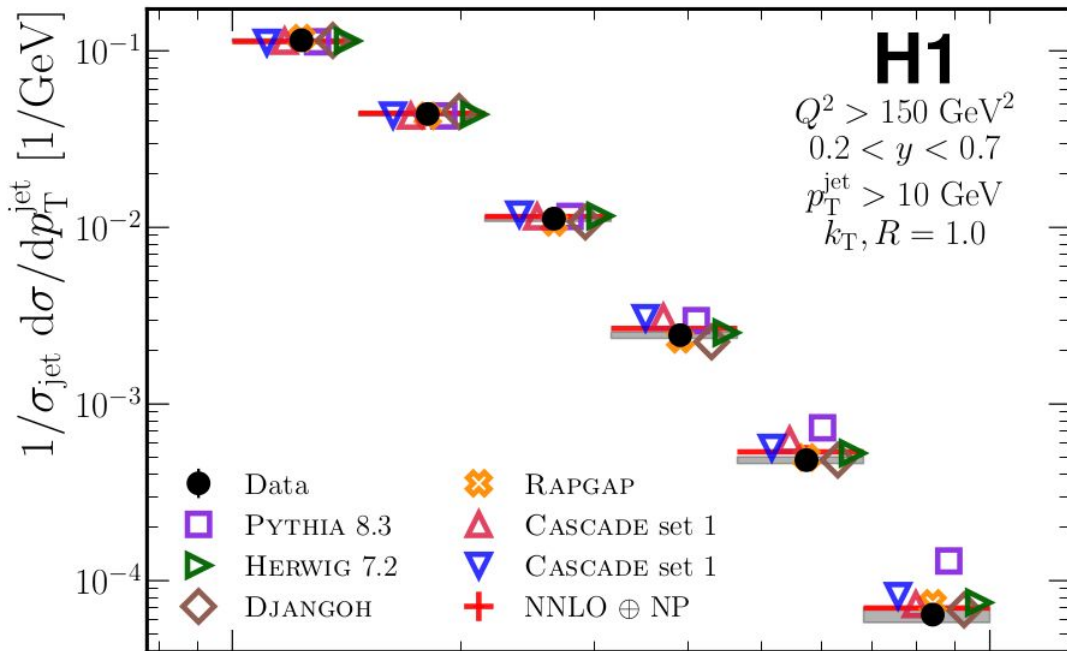
Open Access

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

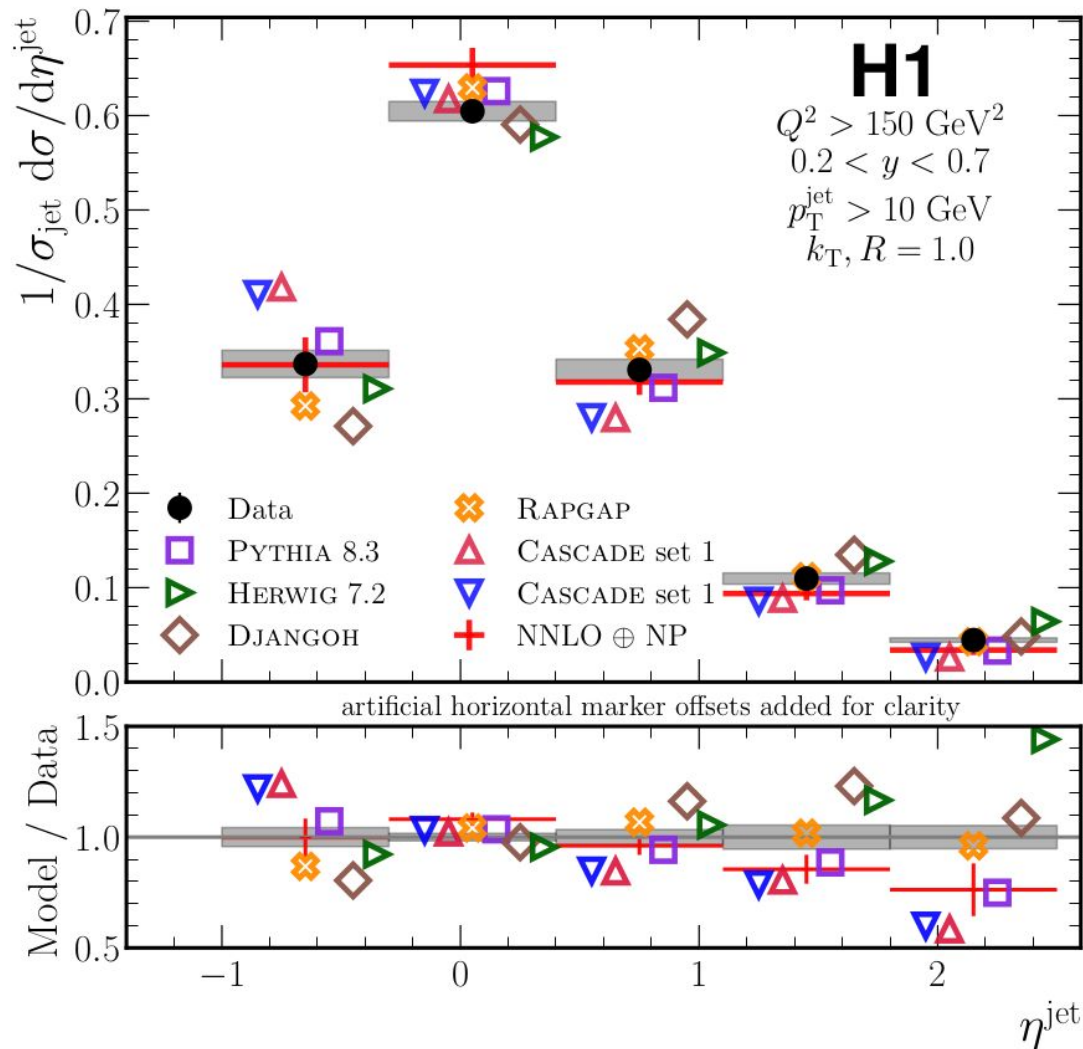
[Article](#) [References](#) [No Citing Articles](#) [Supplemental Material](#) [PDF](#) [HTML](#) [Export Citation](#)





## Jet transverse momentum

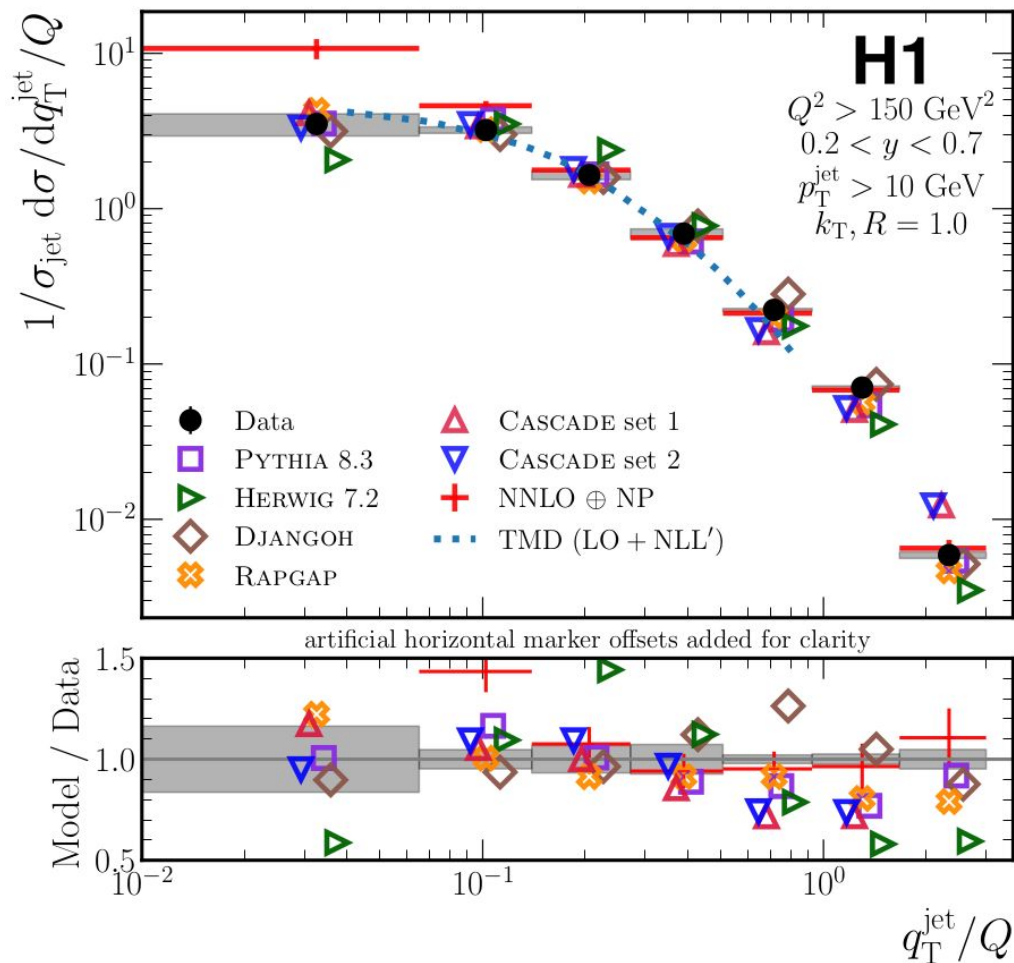
Well described by NNLO calculation, and some MCs like Herwig and Djangoh



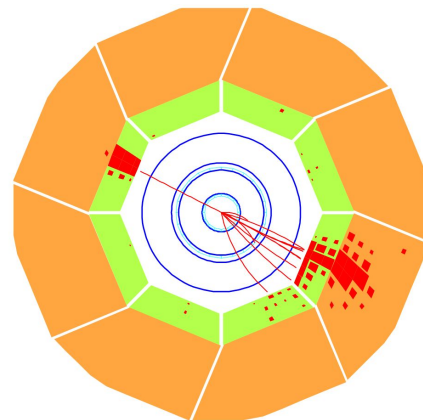
## Jet pseudorapidity

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

Well described by Rapgap

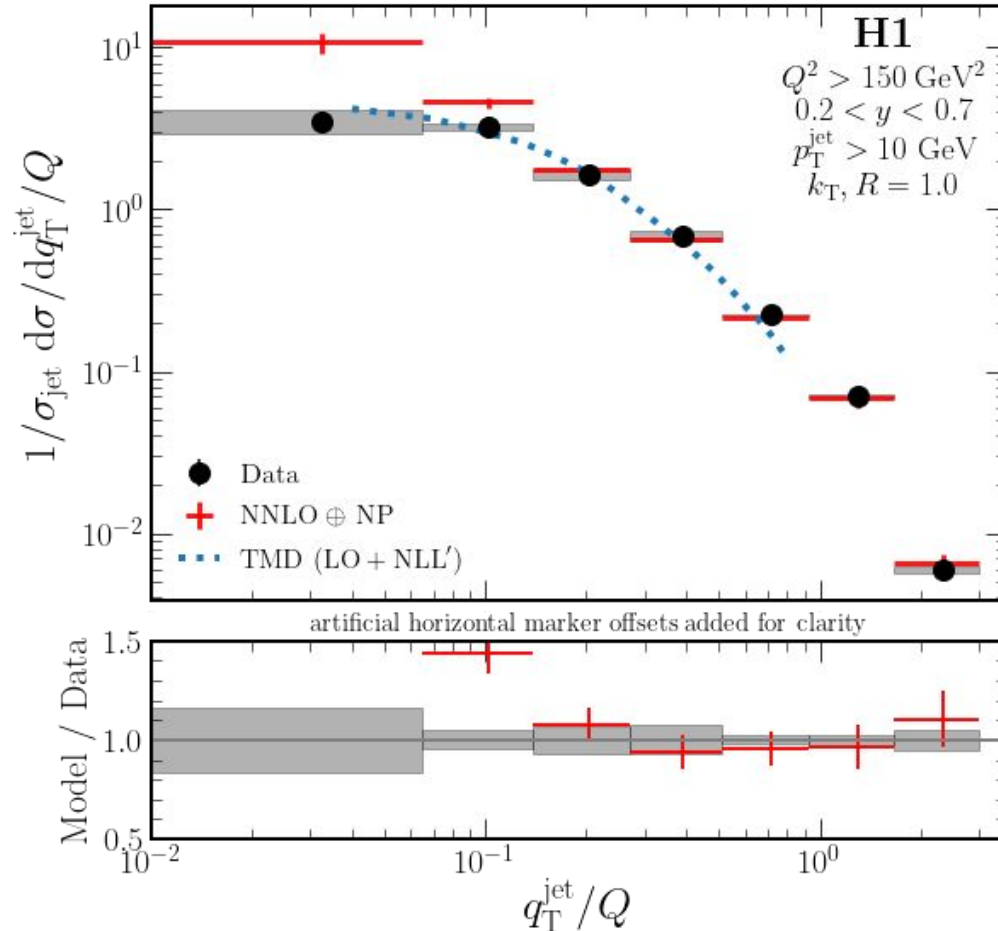


**Lepton-jet momentum imbalance**  $q_T = |\vec{p}_T^e + \vec{p}_T^{\text{jet}}|$



**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**

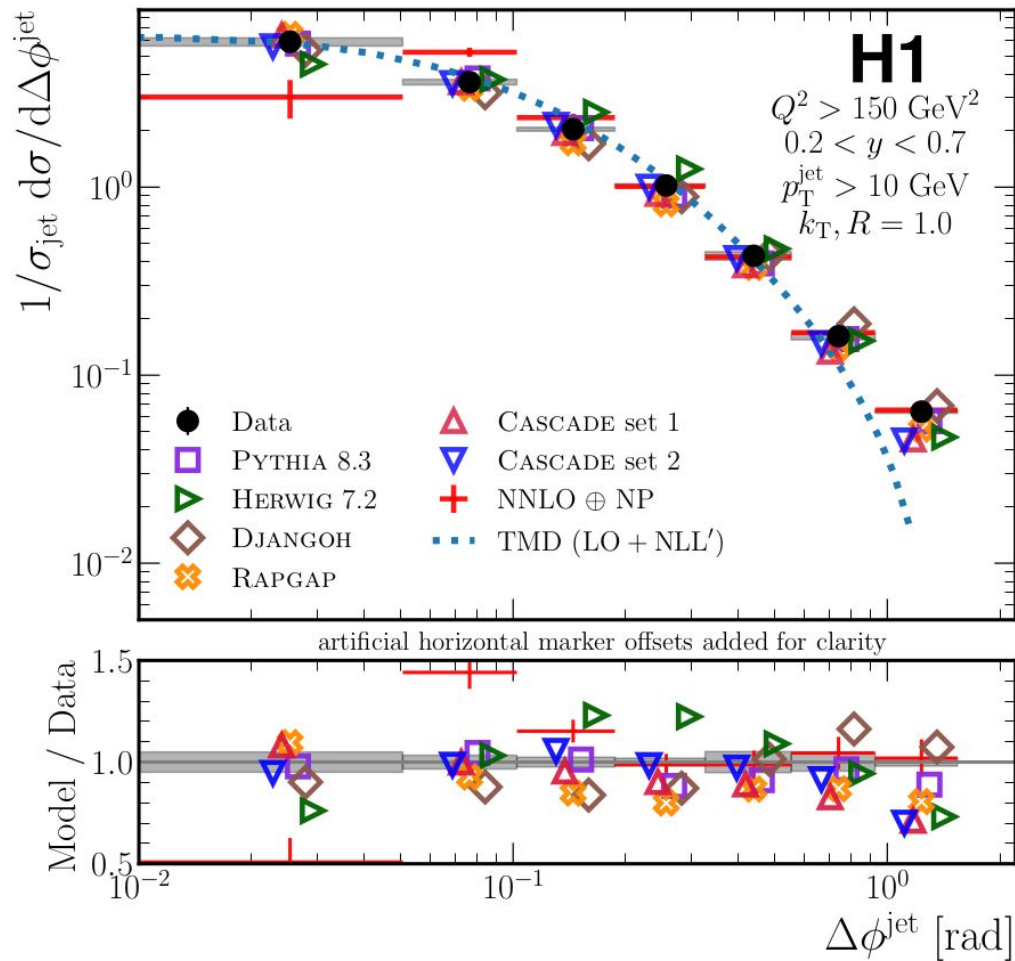


Textbook example of  
 “matching” between  
 collinear and TMD  
 frameworks

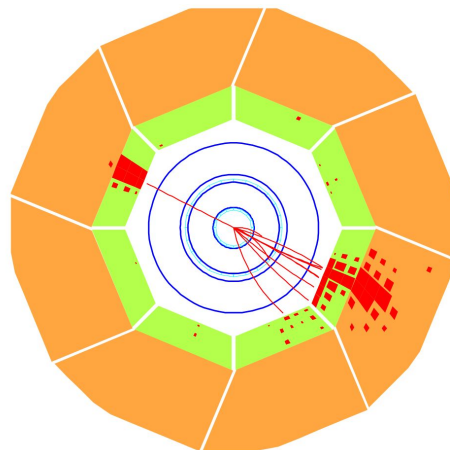
First time seen in DIS!

(not seen in fixed-target  
 DIS)





## Lepton-jet azimuthal correlations

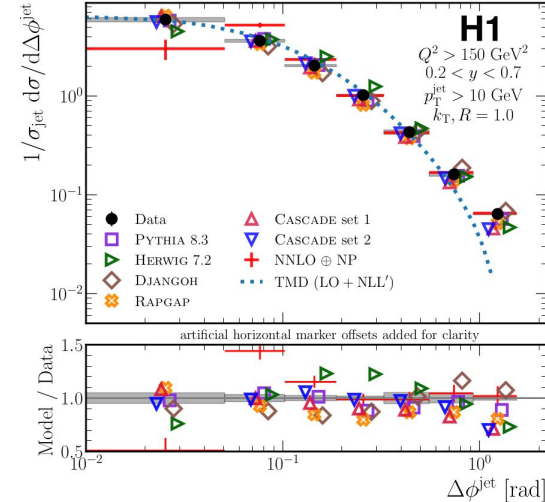
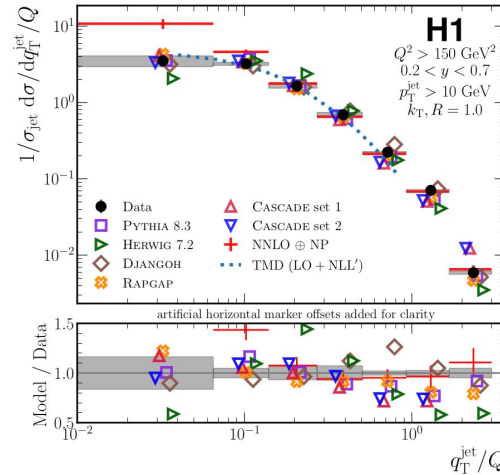
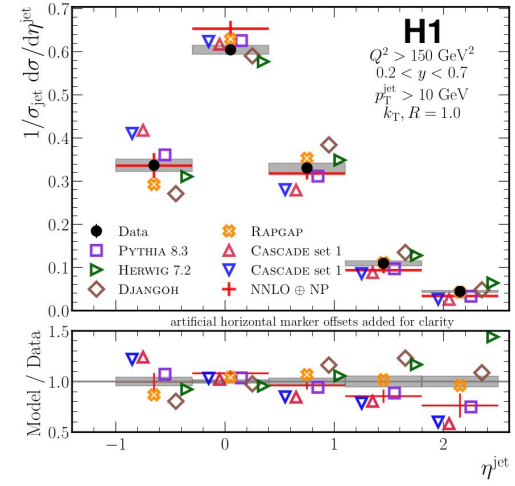
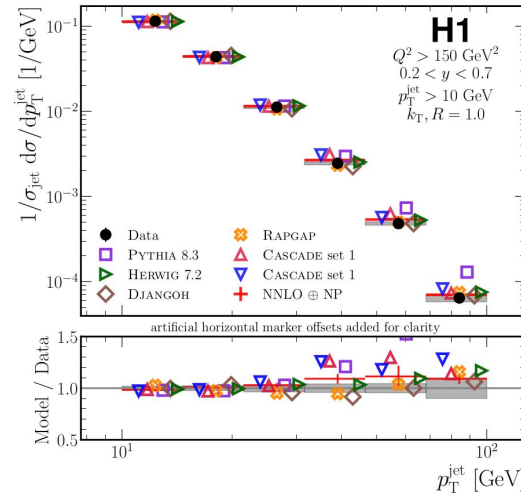


**TMD calculation does a great job at low  $q_T$ ; collinear calculation does a great job at large  $q_T$ .**

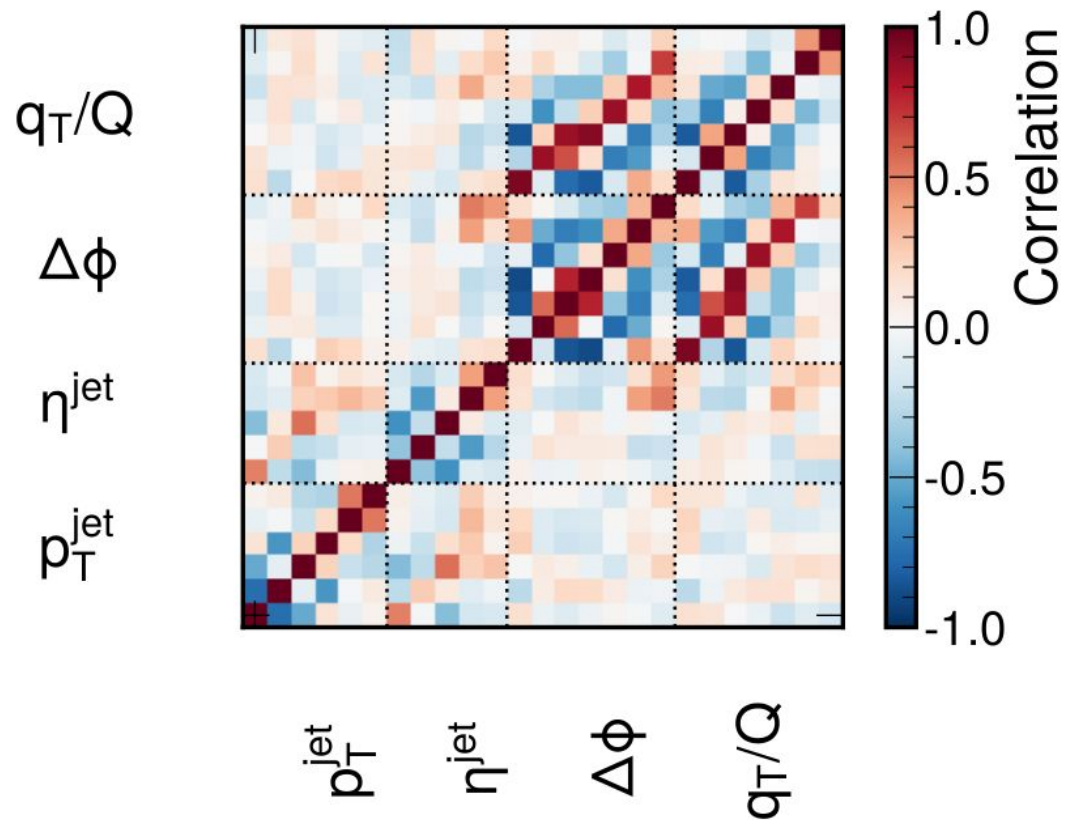
**Large overlap between collinear and TMD frameworks**

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

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

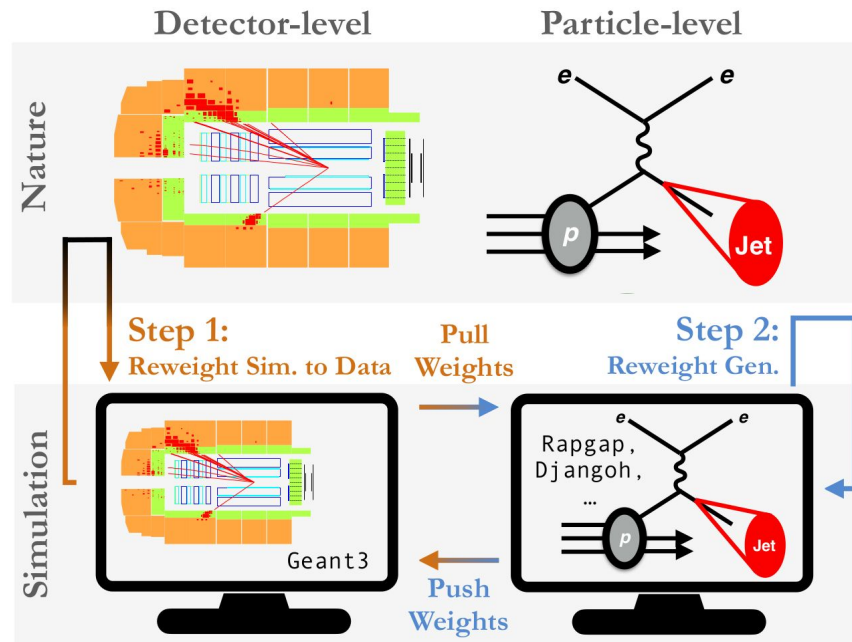


# Simultaneous unfolding $\rightarrow$ Correlations

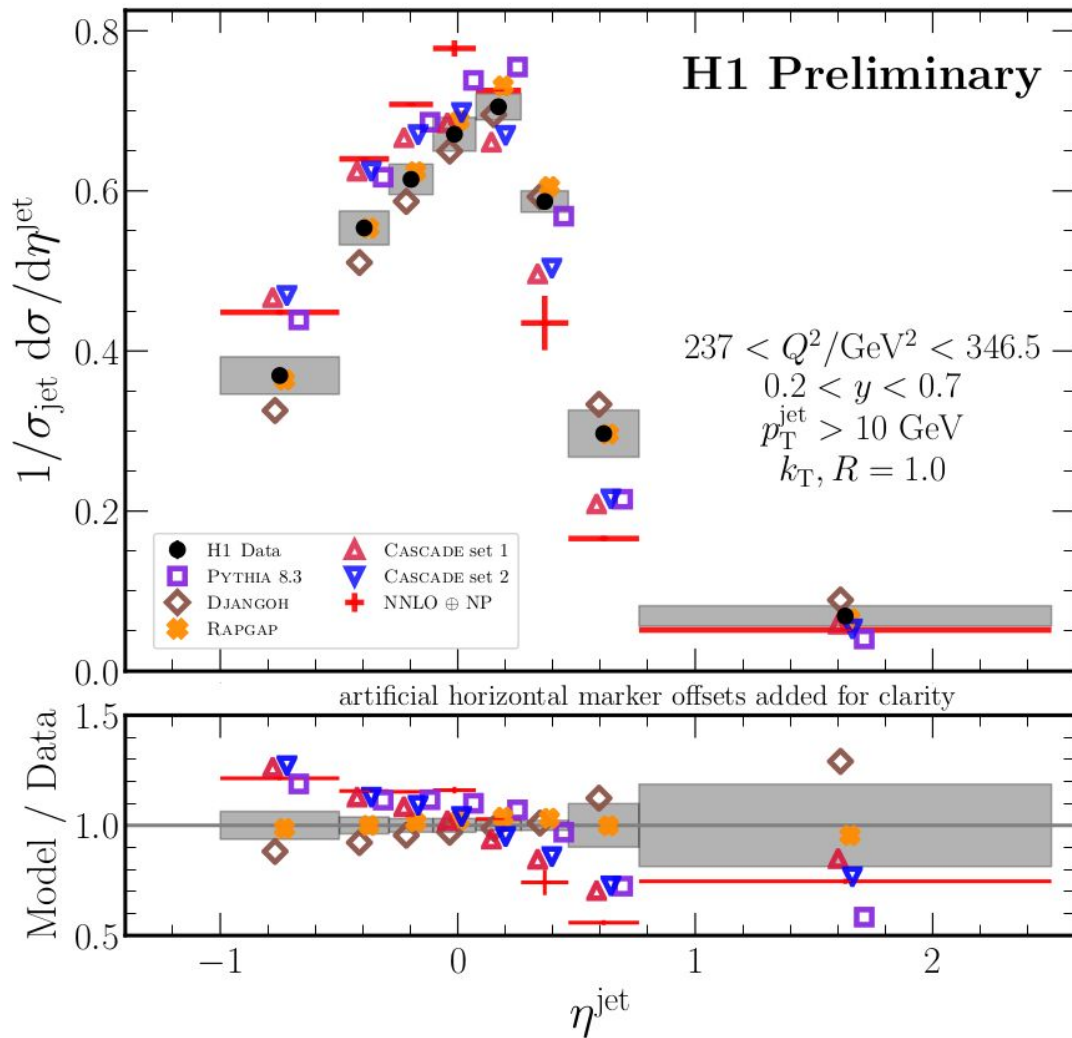


*“This measurement also represents a milestone in the use of ML techniques for experimental physics, as it provides the first example of ML-assisted unfolding,.... This opens up the possibility for high dimensional explorations of nucleon structure with H1 data and beyond”*

Phys. Rev. Lett. 128, 132002

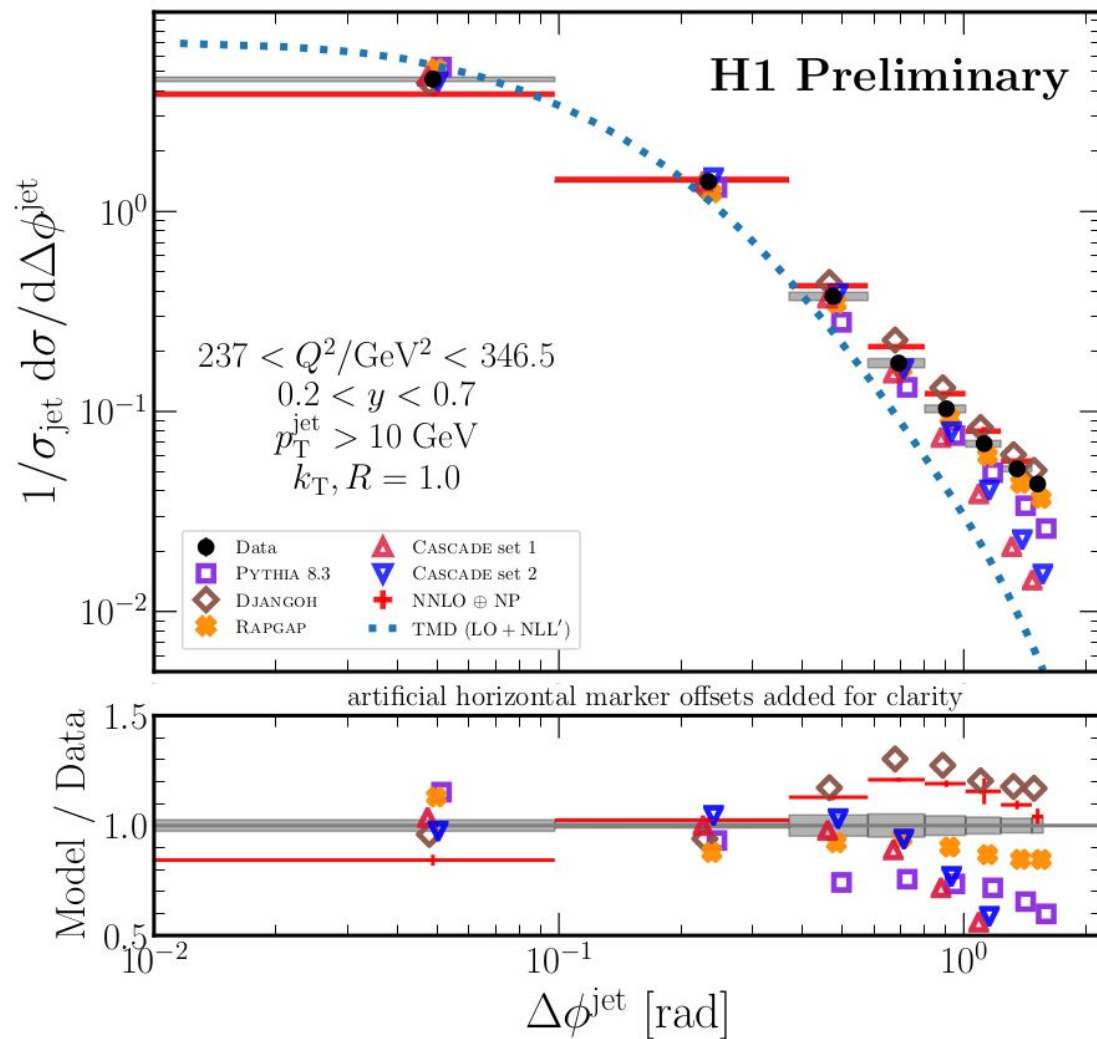


# Jet pseudorapidity in slice of Q2.





# Lepton-jet azimuthal correlation in slice of Q2.

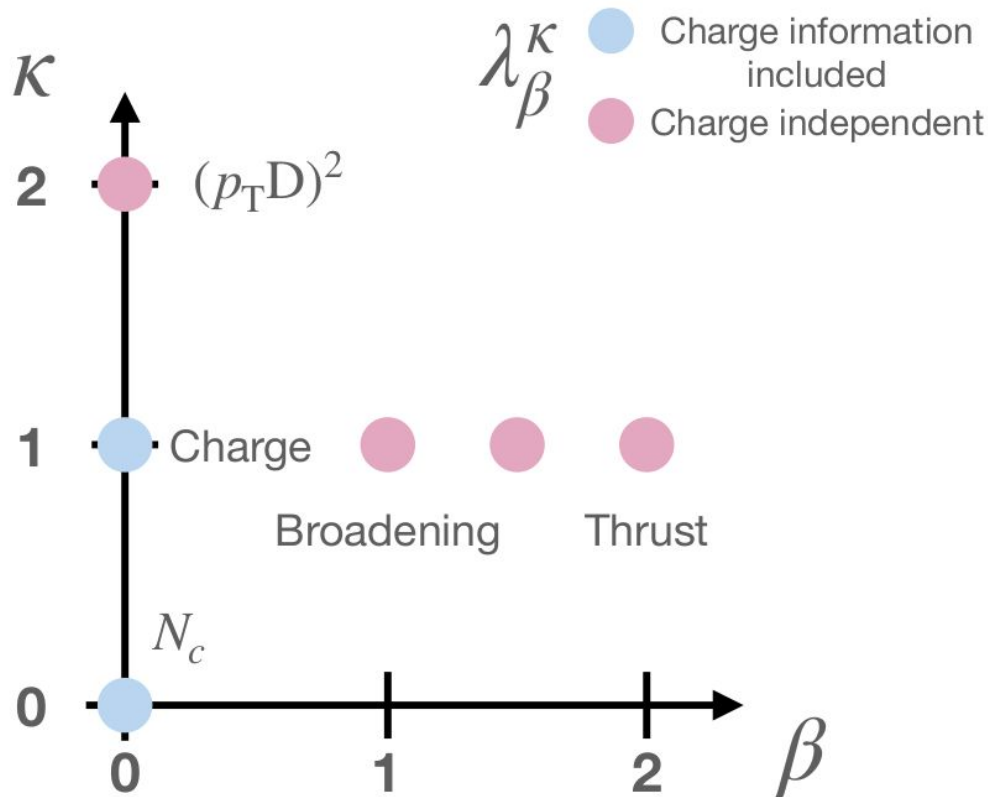


# Jet substructure observables with machine learning

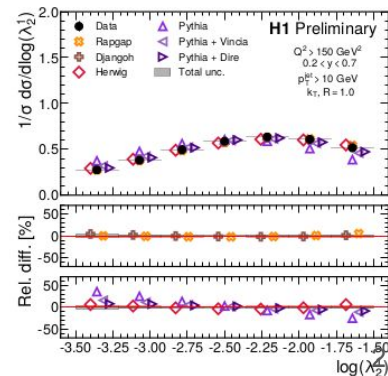
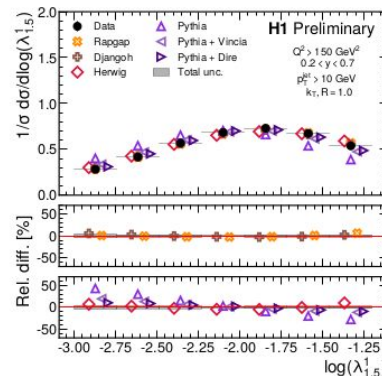
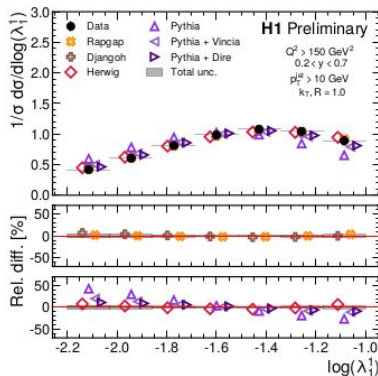
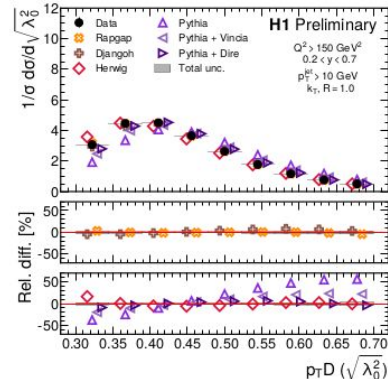
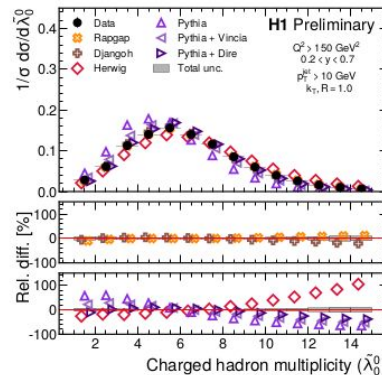
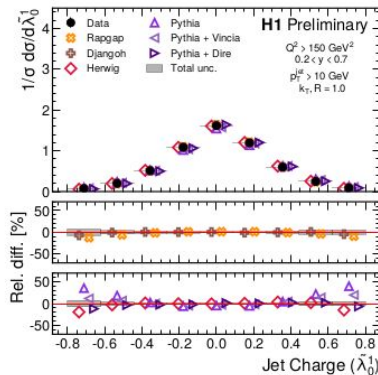
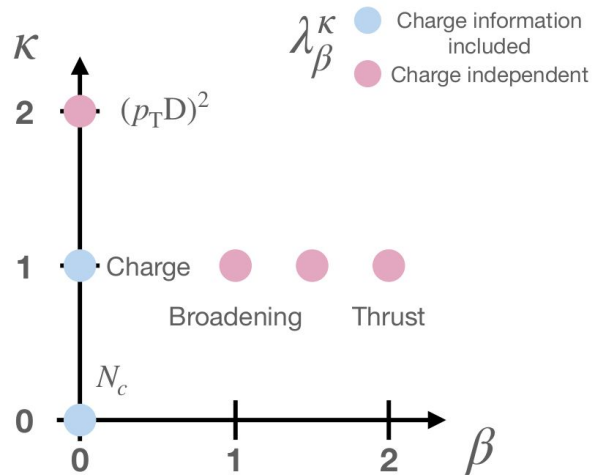
<https://www-h1.desy.de/h1/www/publications/htmlsplit/H1prelim-22-034.long.html>

$$\lambda_{\beta}^{\kappa} = \sum_{i \in \text{jet}} z_i^{\kappa} \left( \frac{R_i}{R_0} \right)^{\beta}$$

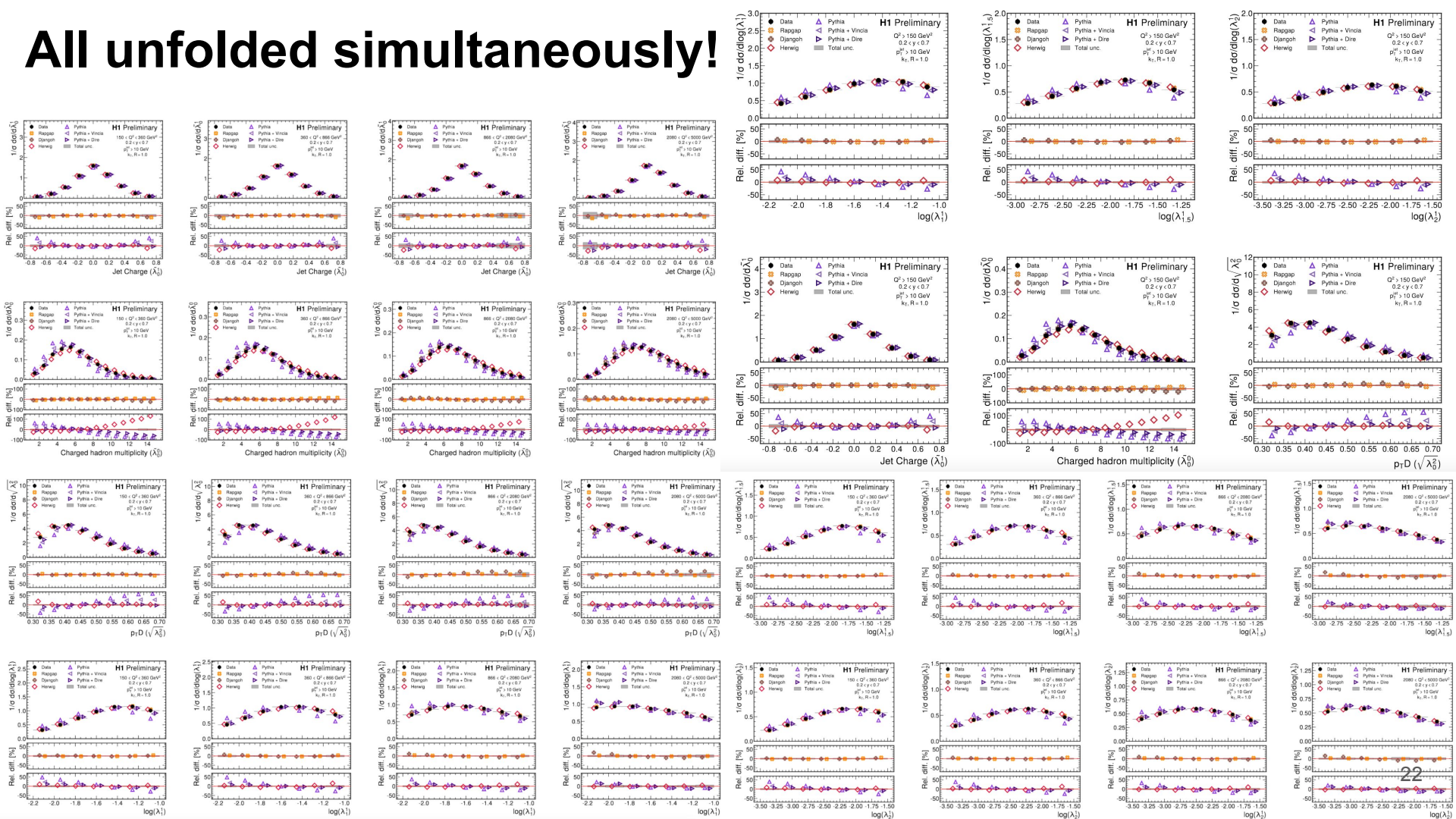
$$\tilde{\lambda}_0^{\kappa} = Q_{\kappa} = \sum_{i \in \text{jet}} q_i \times z_i^{\kappa}.$$



# All of them unfolded simultaneously!!!



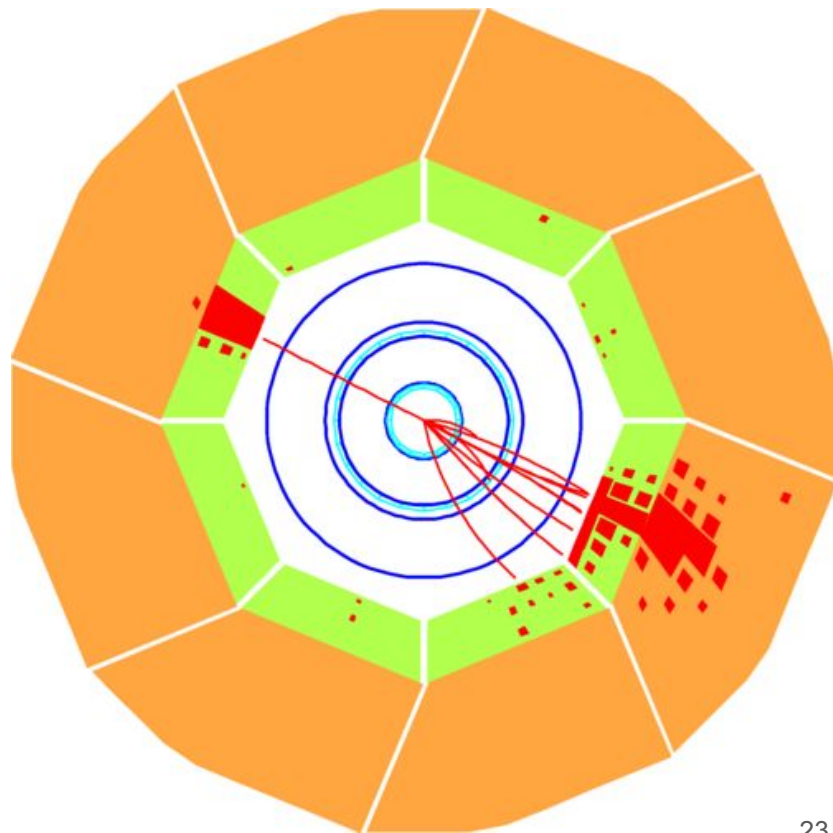
# All unfolded simultaneously!



# The road towards EIC during this decade

Every jet-related  
observable in ep collisions  
**can and will be measured**  
with H1 data

**The ultimate “reference”**  
for future polarized ep and  
eA data at EIC





# 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

PDF

## HTML

### Export Citation

H1prelim-22-034

## Jet Substructure at high $Q^2$ using machine learning

[Document](#)  [H1 Info](#)

Figures: (1) (2a) (2b) (2c) (2d) (2e) (2f) (3a) (3b) (3c) (3d) (3e) (3f) (3g) (3h) (3i) (3j) (3k) (3l) (3m) (3n) (3o) (3p) (3q) (3r) (5k) (5l) (5m) (5n) (5o) (5p) (5q) (5r) (5s) (5t) (5u) (5v) (5w) (5x) (use mouse for preview)

H1prelim-22-033

Groomed event shaps in high  $Q^2$  DIS

Document  H1 Info

**Figures:** (5a) (5b) (5c) (5d) (5e) (5f) (5g) (5h) (5i) (5j) (5k) (5l) (6a) (6b) (6c) (6d) (6e) (6f) (7a) (7b) (7c) (7d) (7e) (7f) (7g)

H1prelim-22-032


### Charge asymmetry Jet substructure in DIS

Document  H1 Info

**Figures:** [\(1\)](#) [\(2\)](#) [\(3a\)](#) [\(3b\)](#) [\(3c\)](#) [\(4a\)](#) [\(4b\)](#) [\(5a\)](#) [\(5b\)](#) [\(6\)](#) [\(7\)](#) [\(9\)](#) [\(10\)](#) [\(11\)](#) [\(12\)](#) [\(13\)](#) [\(14\)](#) (use mouse for preview)

H1prelim-21-032

### Measurement of 1-jettiness in the Breit Frame at high $Q^2$

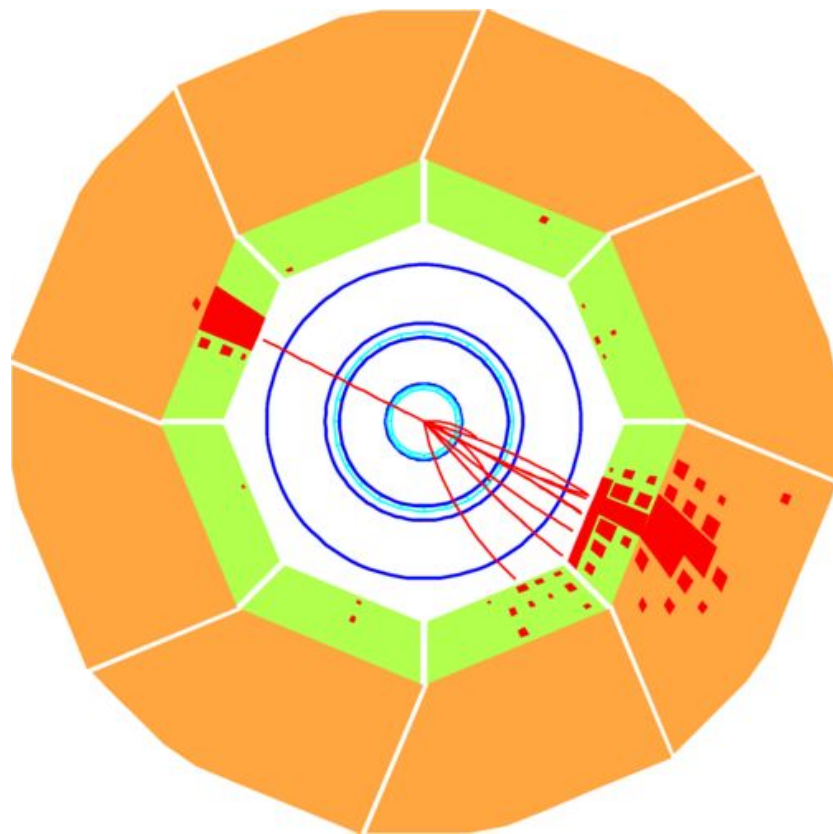
Document  H1 Info

**Stay tuned.**  
Just the  
beginning of a  
new & rich  
jet program

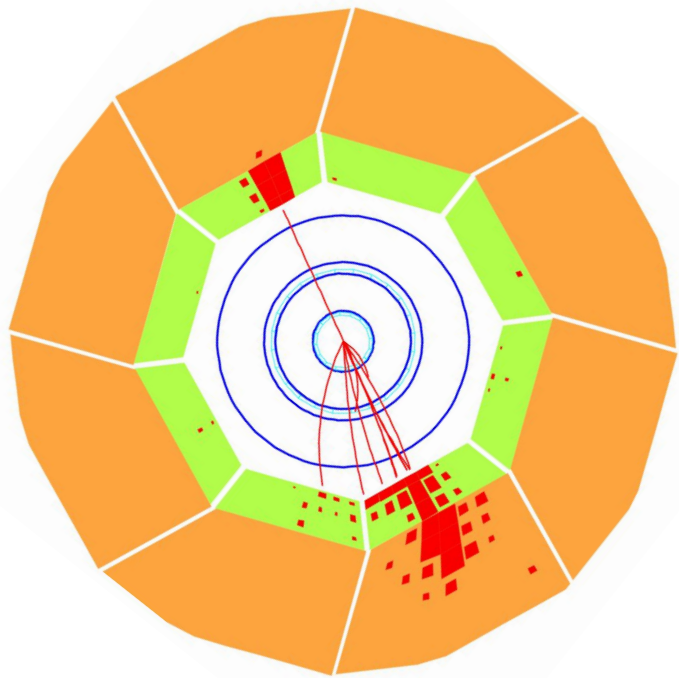
[https://www-h1.desy.de/publications/H1preliminary.short\\_list.html](https://www-h1.desy.de/publications/H1preliminary.short_list.html)

# Summary

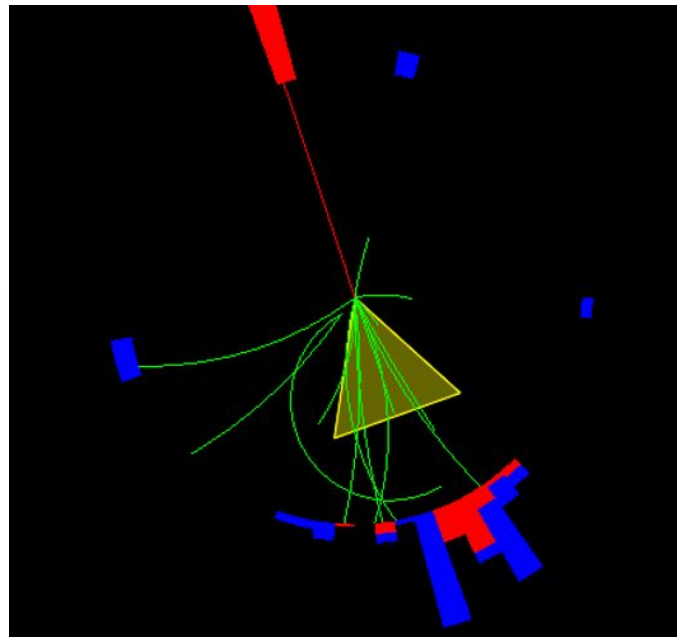
- We report a measurement of lepton jet momentum and azimuthal imbalance in DIS, which provide **a new way to constrain TMD PDFs and their evolution**
- Pure TMD calculation does a great job at low  $q_T$ ; Pure collinear calculation does a great job at large  $q_T$ . Large overlap. Data can **constrain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



## H1@HERA

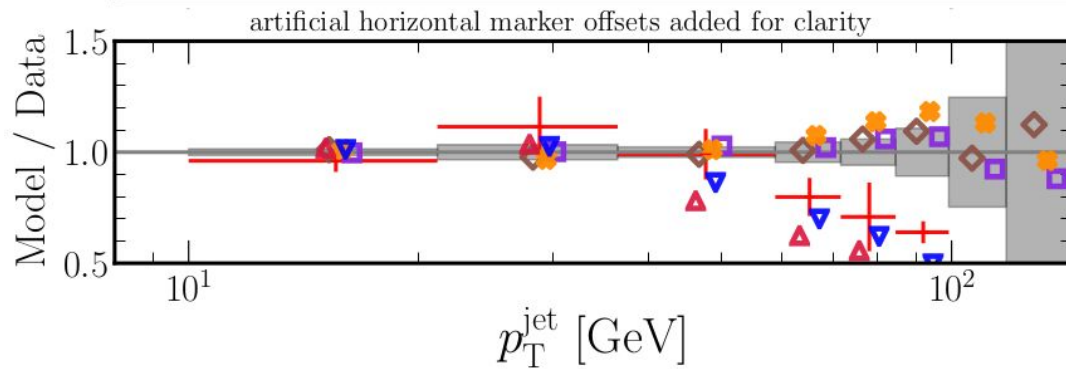
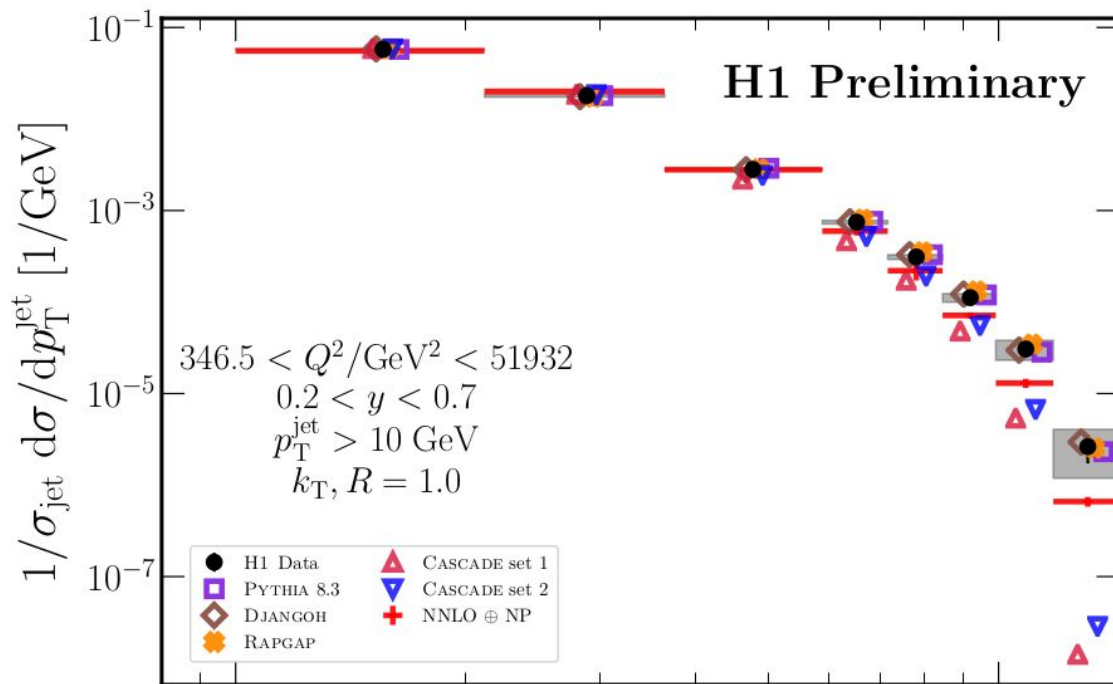


## EIC

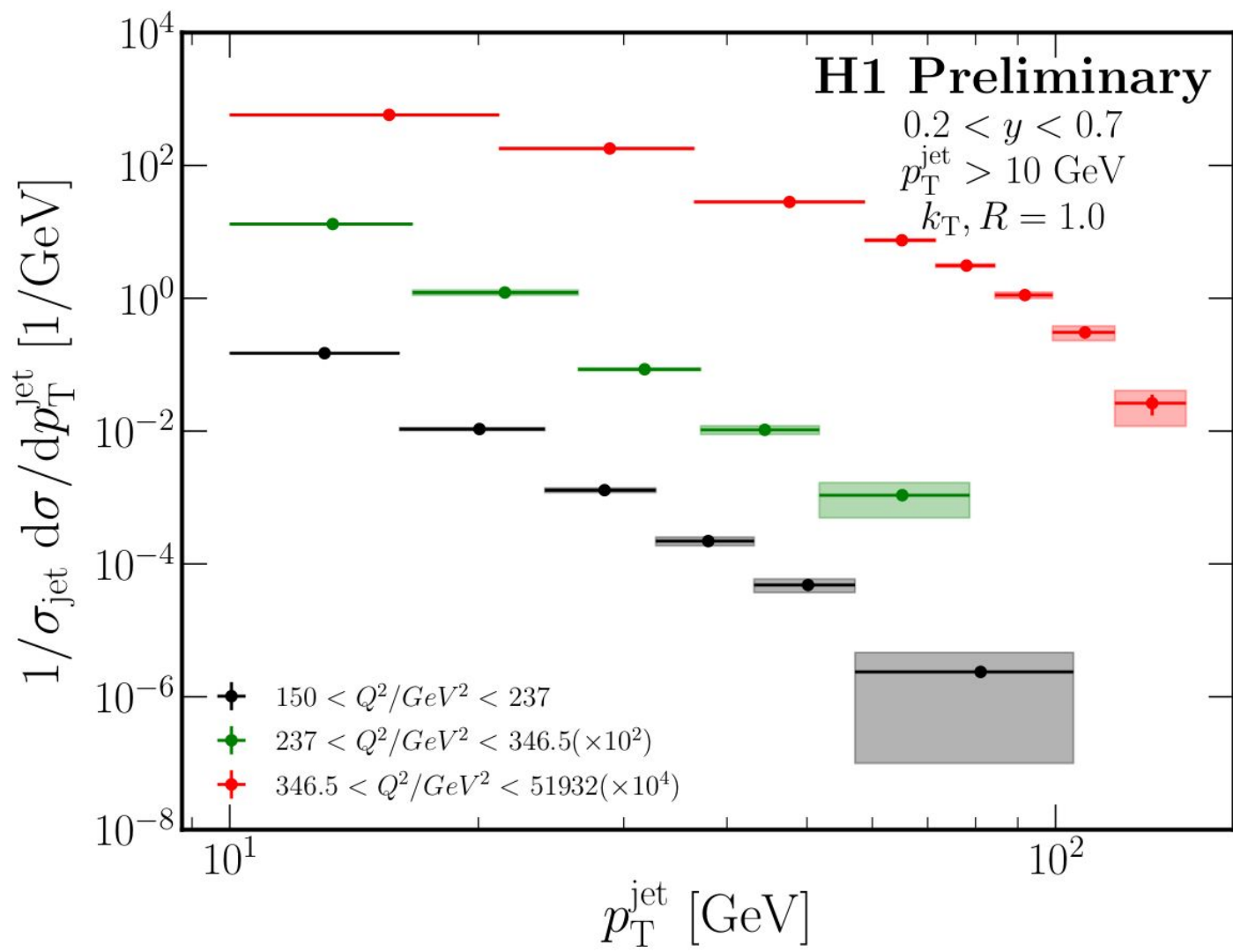


# Backup

# Jet transverse momentum in slice of Q2.







# Motivation

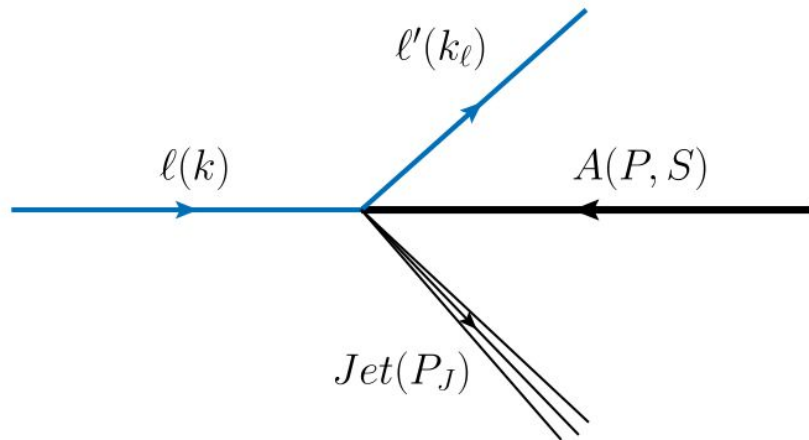
Lepton-jet imbalance  $q_T = |\vec{k}_{l\perp} + \vec{p}_{\perp}^j|$

In Born-level configuration

Probes quark TMD PDFs

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

Gutierrez et al. PRL. 121, 162001 (2019)



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