

# ML-assisted measurements of lepton-jet asymmetries in DIS @ H1

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on behalf of the **H1** Collaboration

EPS-HEP 2023 Conference

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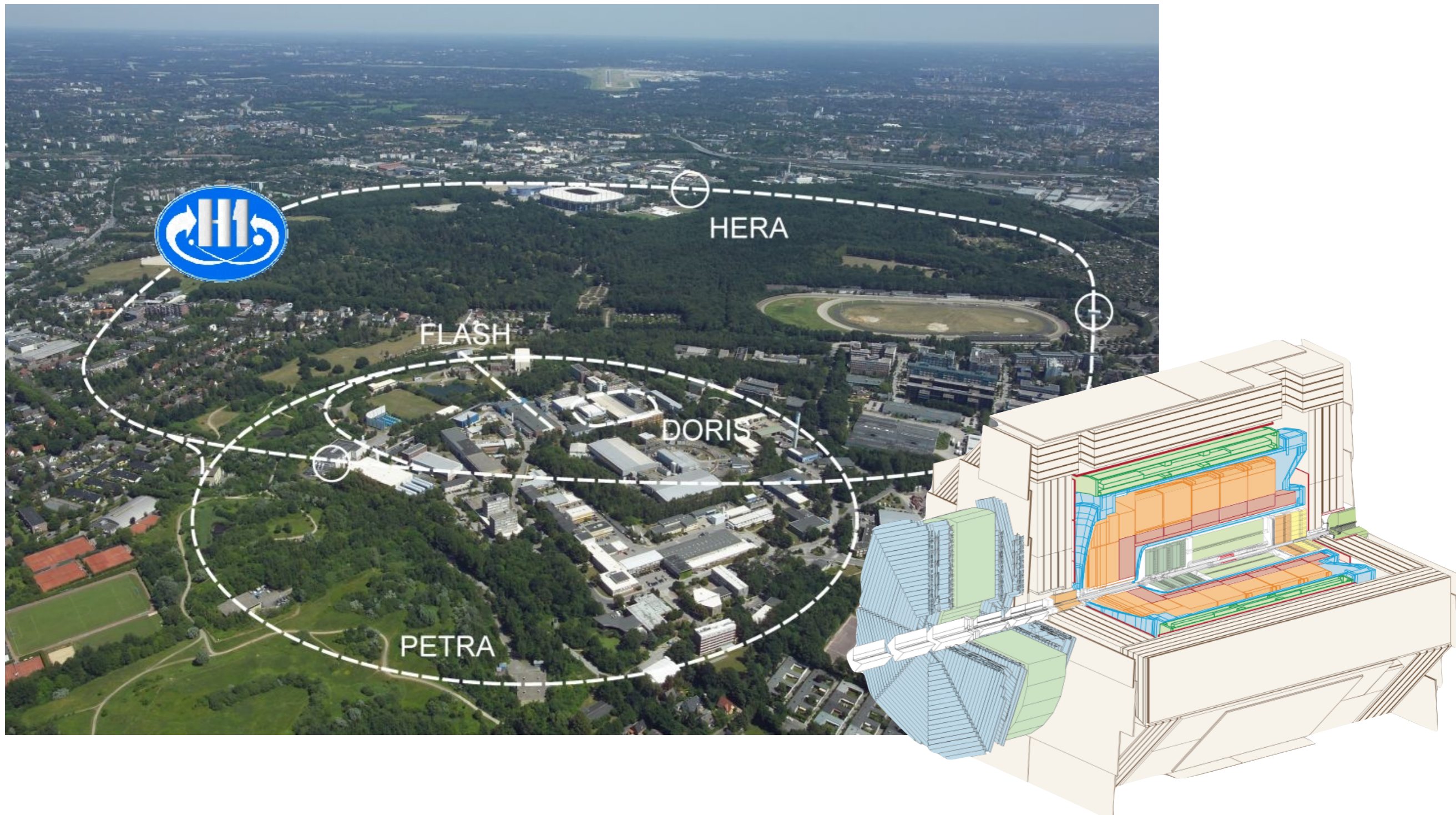
Aug. 21, 2023



# H1 @ HERA

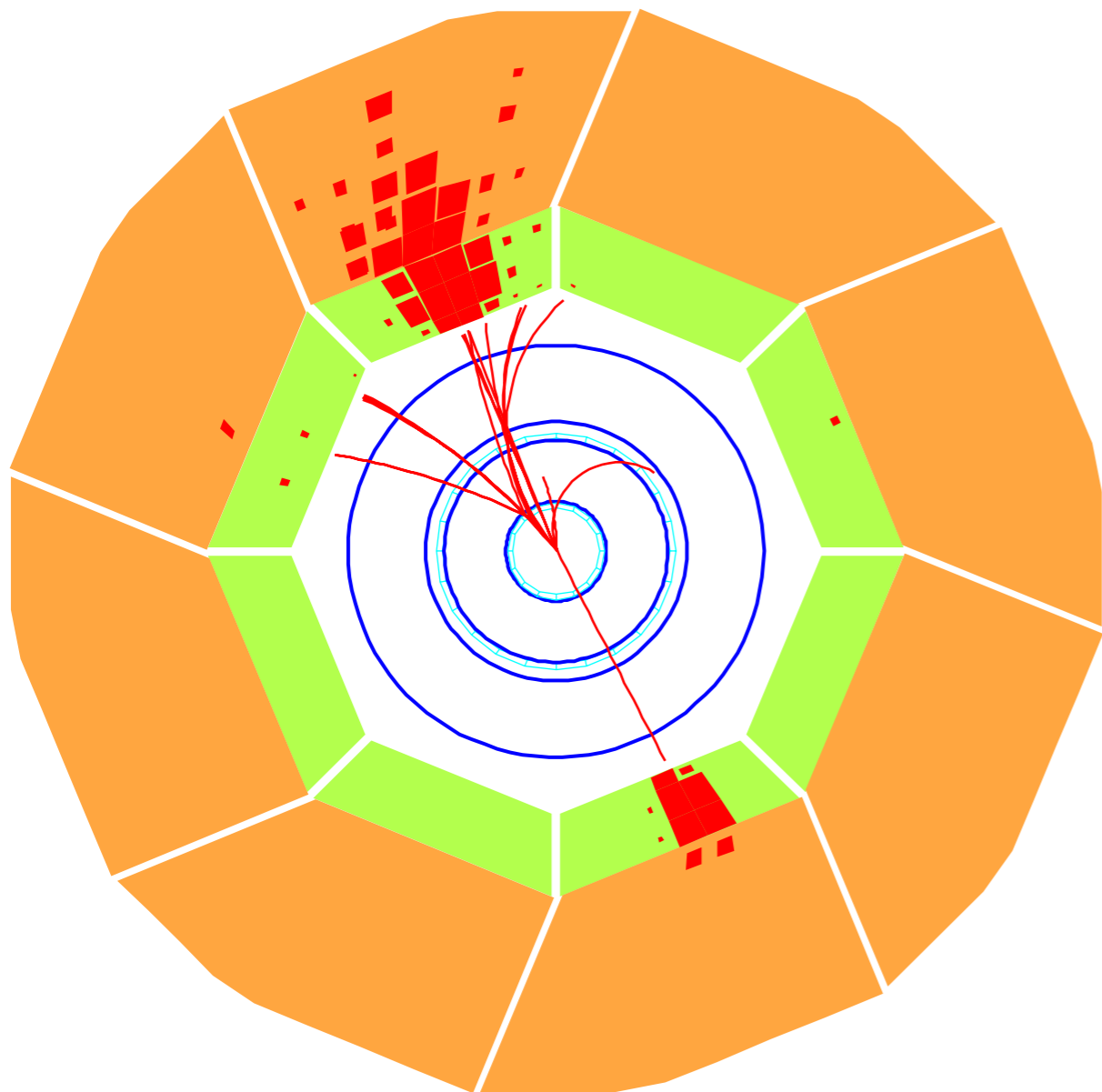


H1 was one of two multipurpose experiments at HERA.

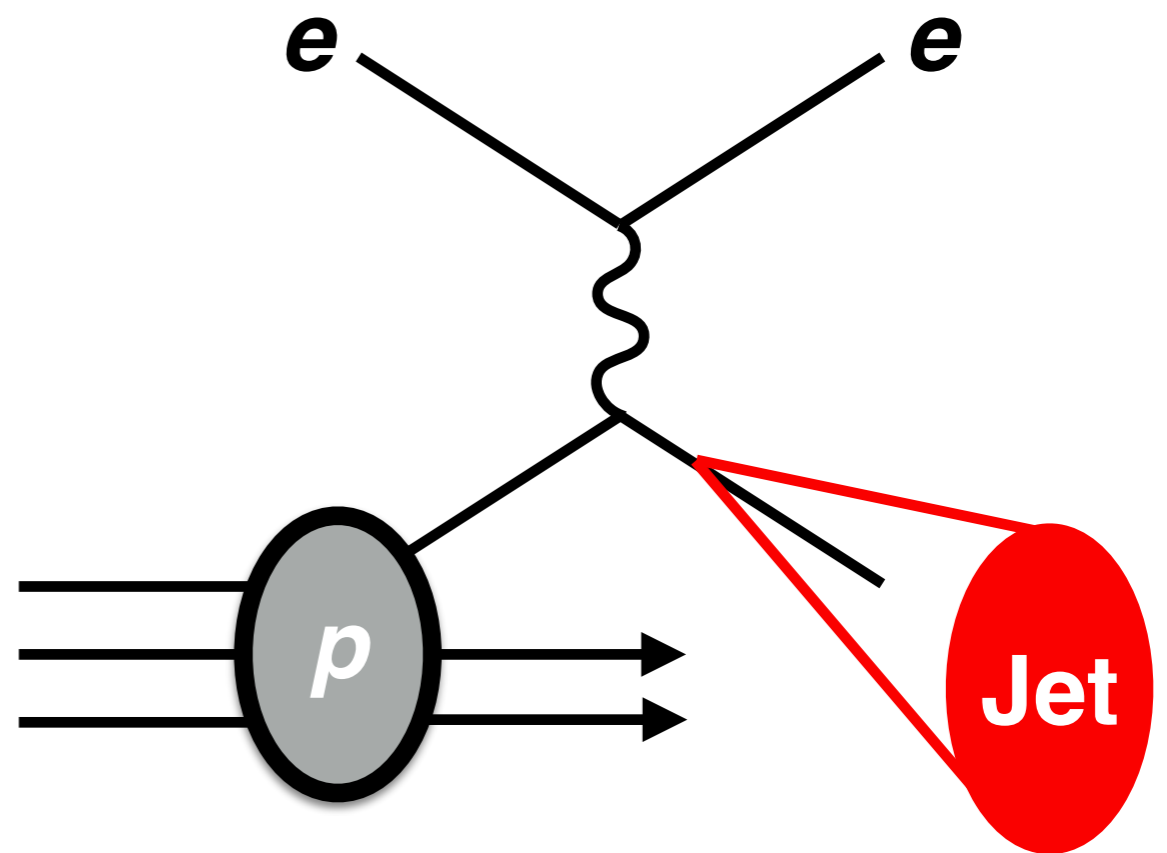


H1 was one of two multipurpose experiments at HERA.

For this talk: 2006-2007 data,  $136 \text{ pb}^{-1}$ , 320 GeV



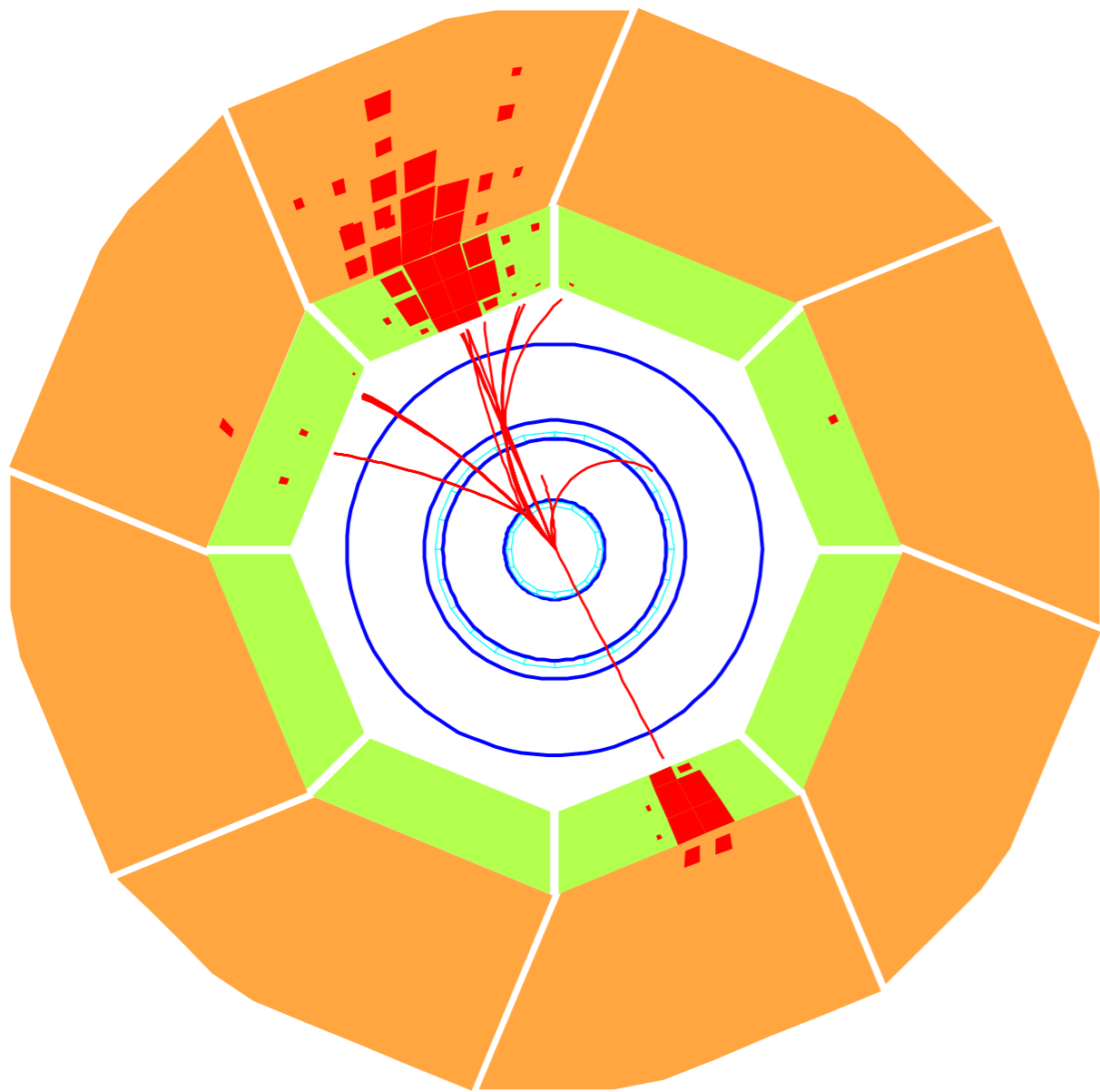
*I'll present measurements of the electron-jet imbalance*



# Why electron-jet imbalance?

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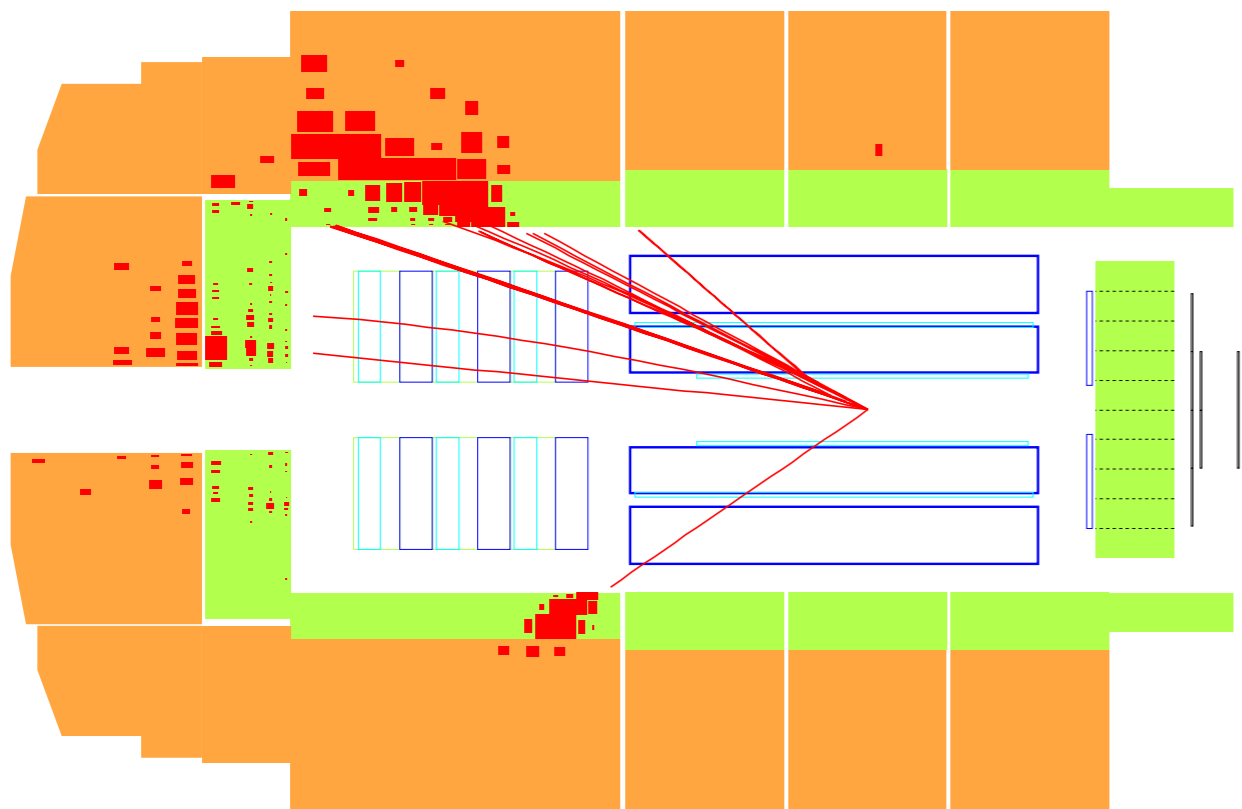
Born-level configuration, electron and jet are back-to-back



Typically, jets are studied in the Breit frame, where the Born-level configuration is discarded

However, jet production in the lab frame can be useful for probing Transverse Momentum Dependent (TMD) Parton Distribution Functions (PDFs)

920 GeV proton



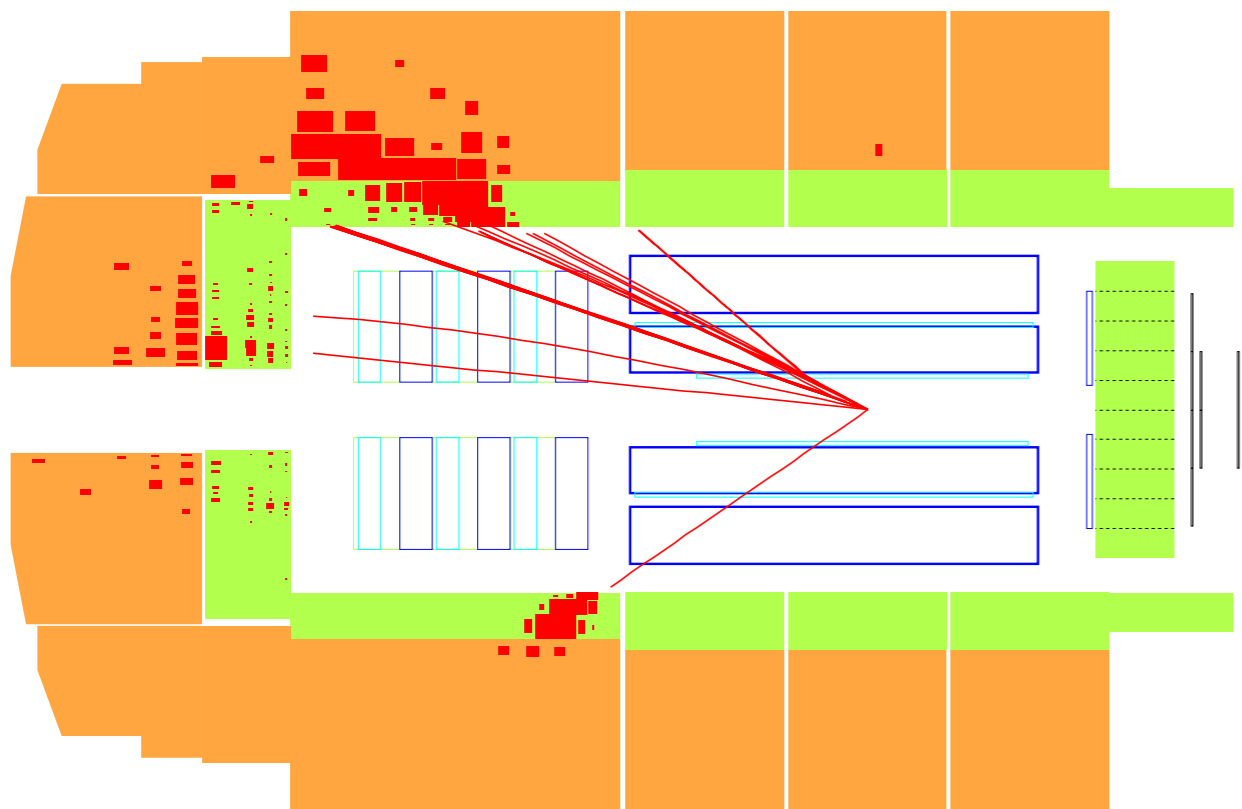
27.6 GeV positron

Energy flow algorithm (HFS) combines information from tracker and calorimeters

Neural network-based energy regression

1% jet energy scale uncertainty; 0.5-1% lepton energy scale uncertainty

920 GeV proton



27.6 GeV positron

Energy flow algorithm (HFS) combines information from tracker and calorimeters

Neural network-based energy regression

1% jet energy scale uncertainty; 0.5-1% lepton energy scale uncertainty

Challenge: **unfold multidimensional phase space**

Energy flow algorithm (HFS)  
combines information from  
imeters

Solution: **use deep learning!**

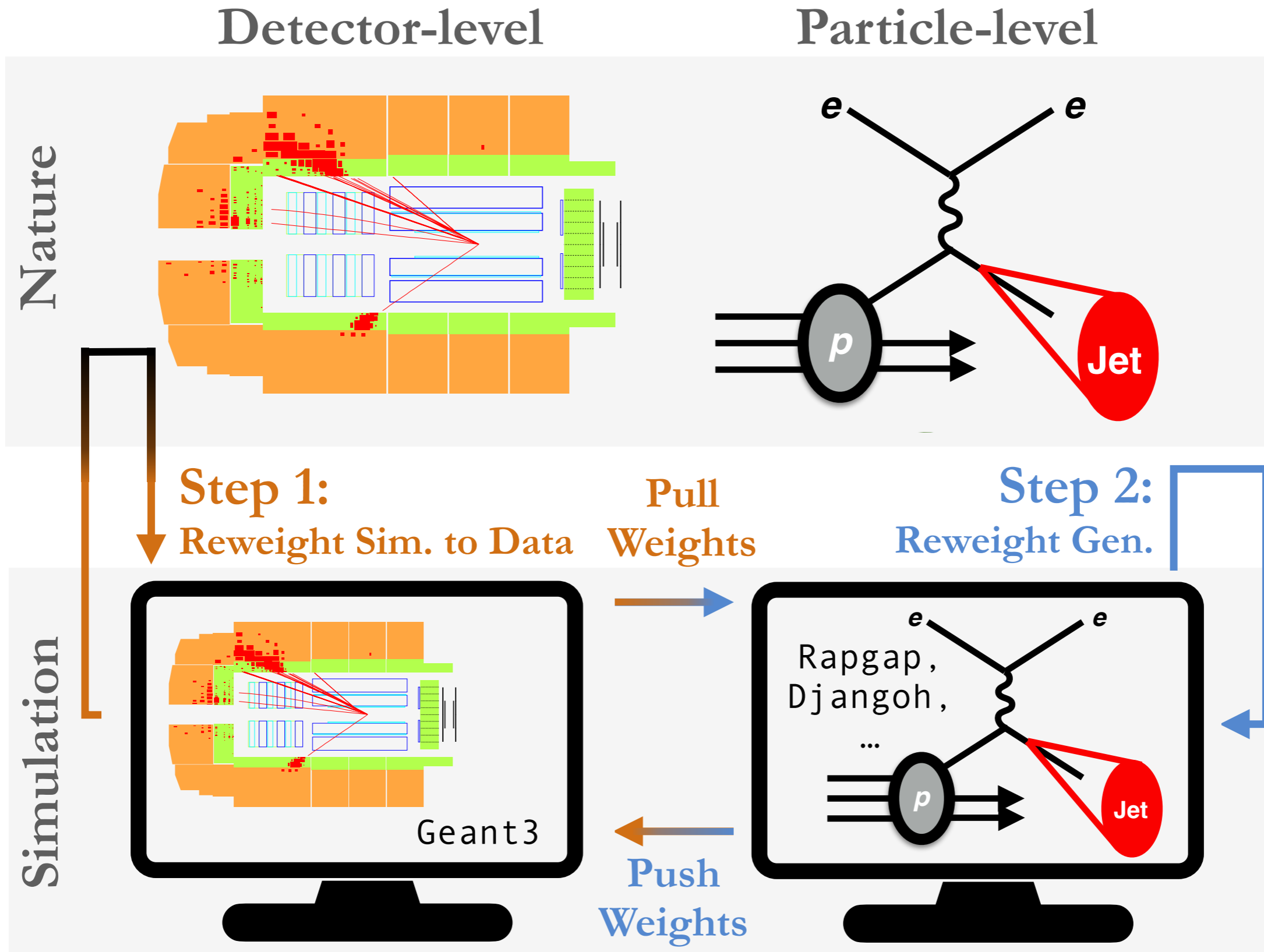
...can do unbinned, high (and  
variable-)dimensional unfolding

based  
sion

cale  
lepton  
uncertainty

Challenge: **unfold multidimensional phase space**

# Unfold by iterating: OmniFold





# Unfold by iterating: OmniFold

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OmniFold is:

- *Unbinned*
- *Maximum likelihood*
- *Full phase space (compute observables post-facto)*
- *Improves the resolution from auxiliary features*

Step 1: Pull

Step 2:

In this measurement: simultaneously unfold lepton and jet kinematics and report binned spectra for jet  $p_T$ ,  $\Delta\phi$ ,  $q_T/Q$ , and jet  $\eta$

Simulation

Geant3

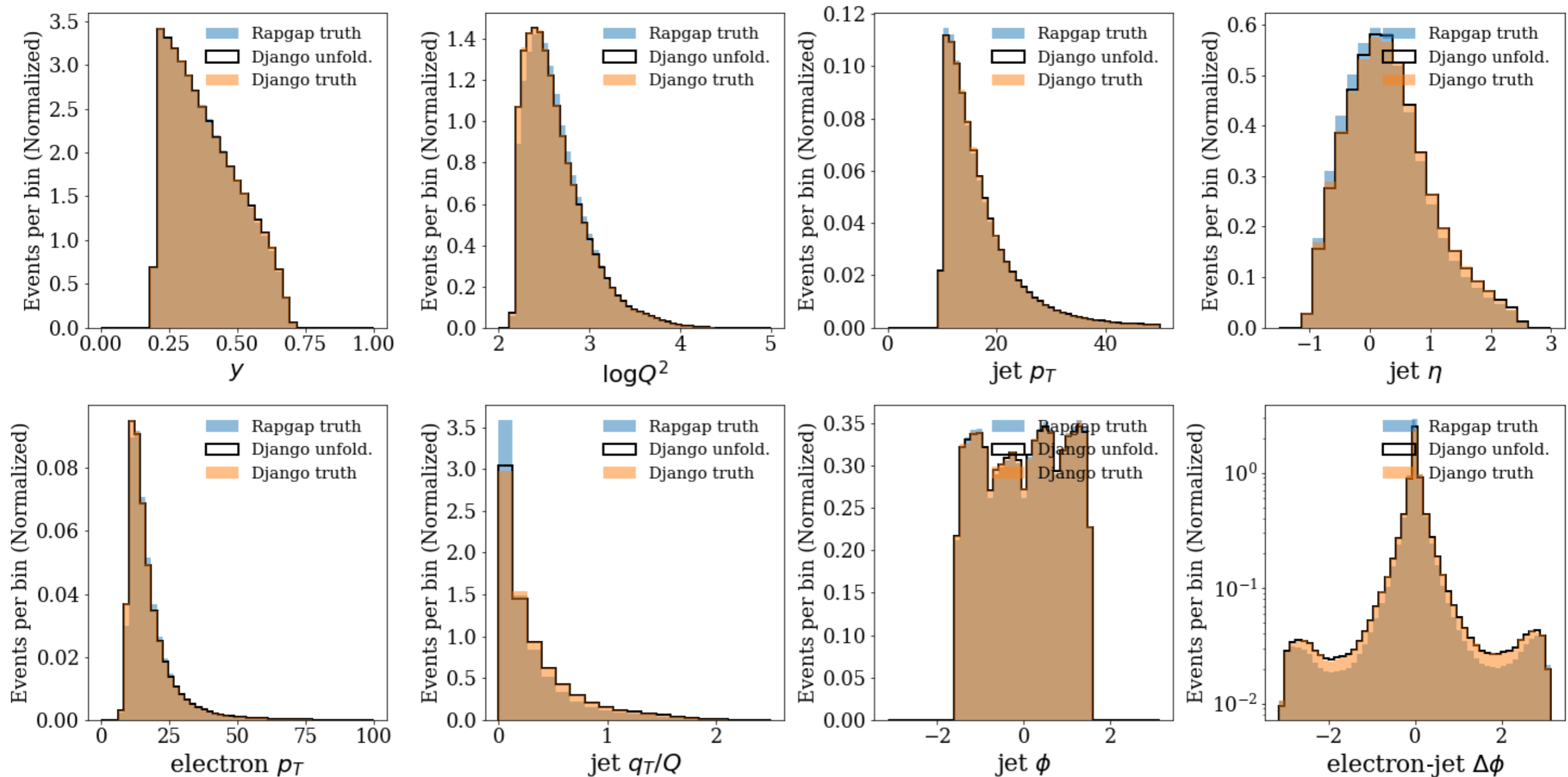
Push Weights

Jet

# OmniFolding $ep$ simulations



We see excellent closure for the full phase space!



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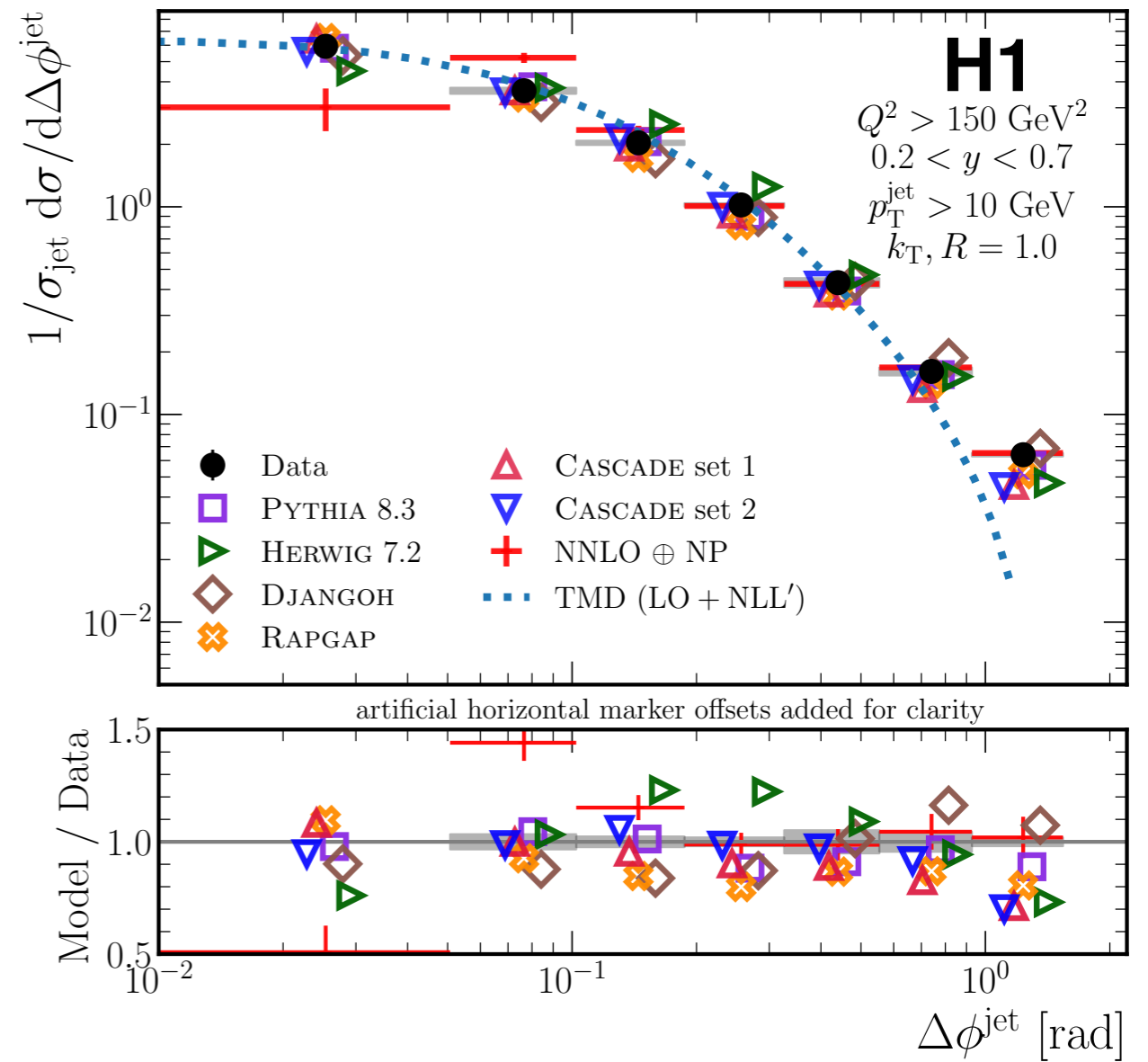
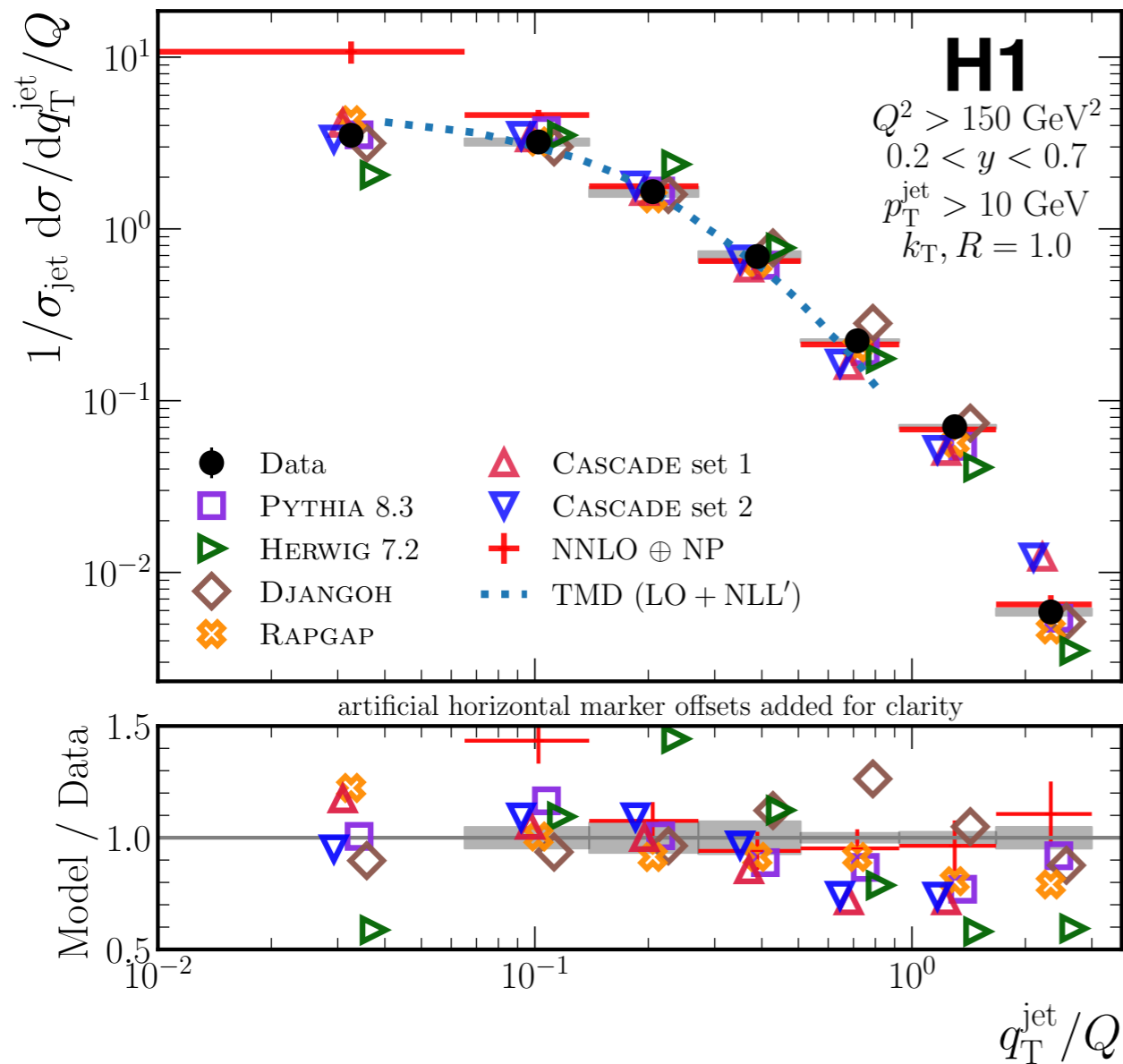
## Measurement of lepton-jet correlation in deep-inelastic scattering with the H1 detector using machine learning for unfolding

H1 Collaboration\*

(To be submitted to Physical Review Letters)

(Dated: August 30, 2021)

The first measurement of lepton-jet momentum imbalance and azimuthal correlation in lepton-proton scattering at high momentum transfer is presented. These data, taken with the H1 detector at HERA, are corrected for detector effects using an unbinned machine learning algorithm (OMNIFOLD), which considers eight observables simultaneously in this first application. The unfolded cross sections are compared to calculations performed within the context of collinear or transverse-momentum-dependent (TMD) factorization in Quantum Chromodynamics (QCD) as well as Monte Carlo event generators. The measurement probes a wide range of QCD phenomena, including TMD parton distribution functions and their evolution with energy in so far unexplored kinematic regions.



Excellent agreement with fixed order at high  $q_T$ ,  
 excellent agreement with TMD prediction at low  $q_T$ .

## H1prelim-22-031

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

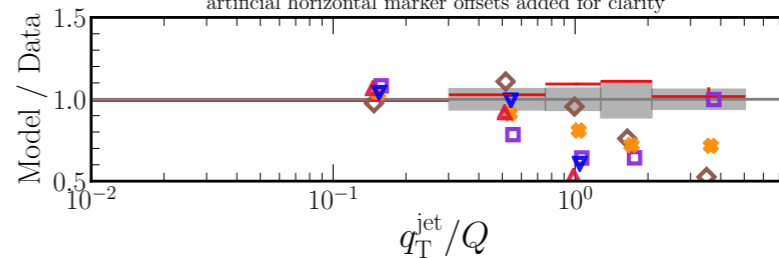
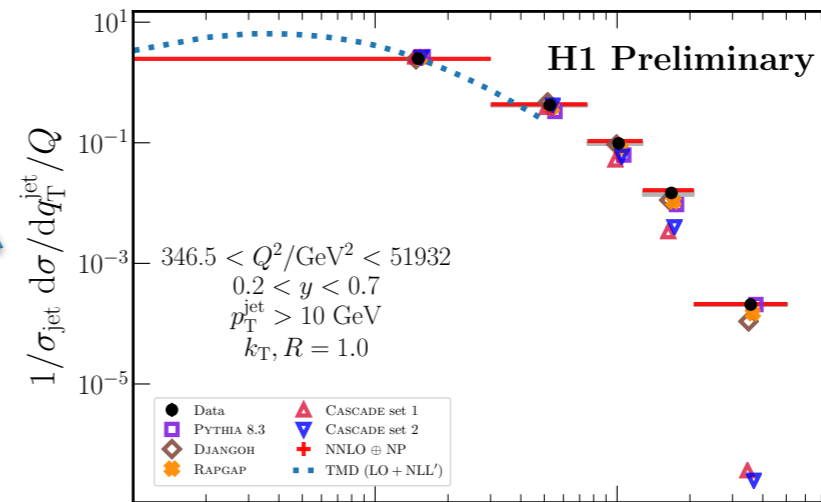
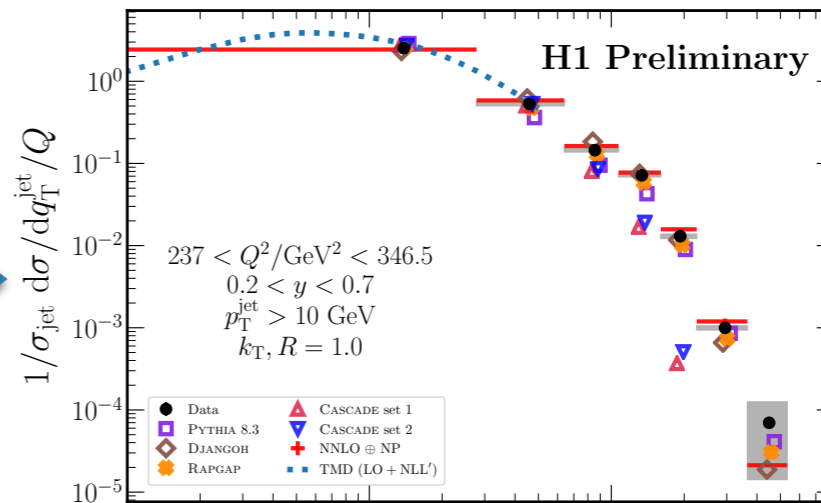
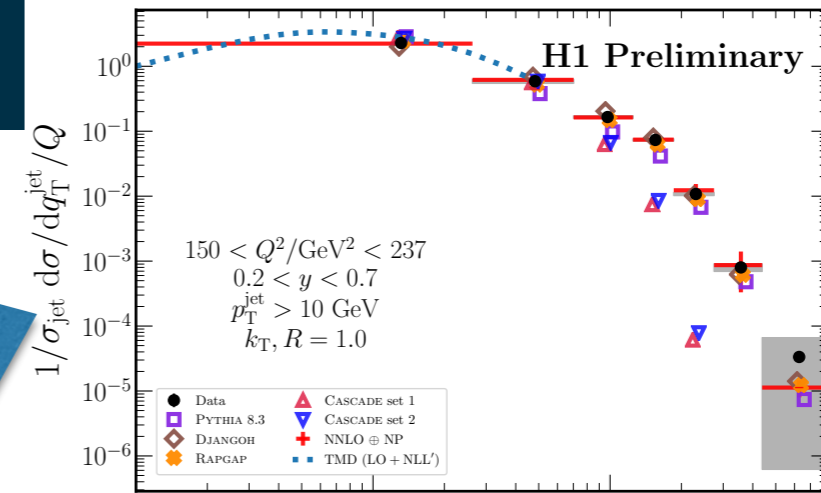
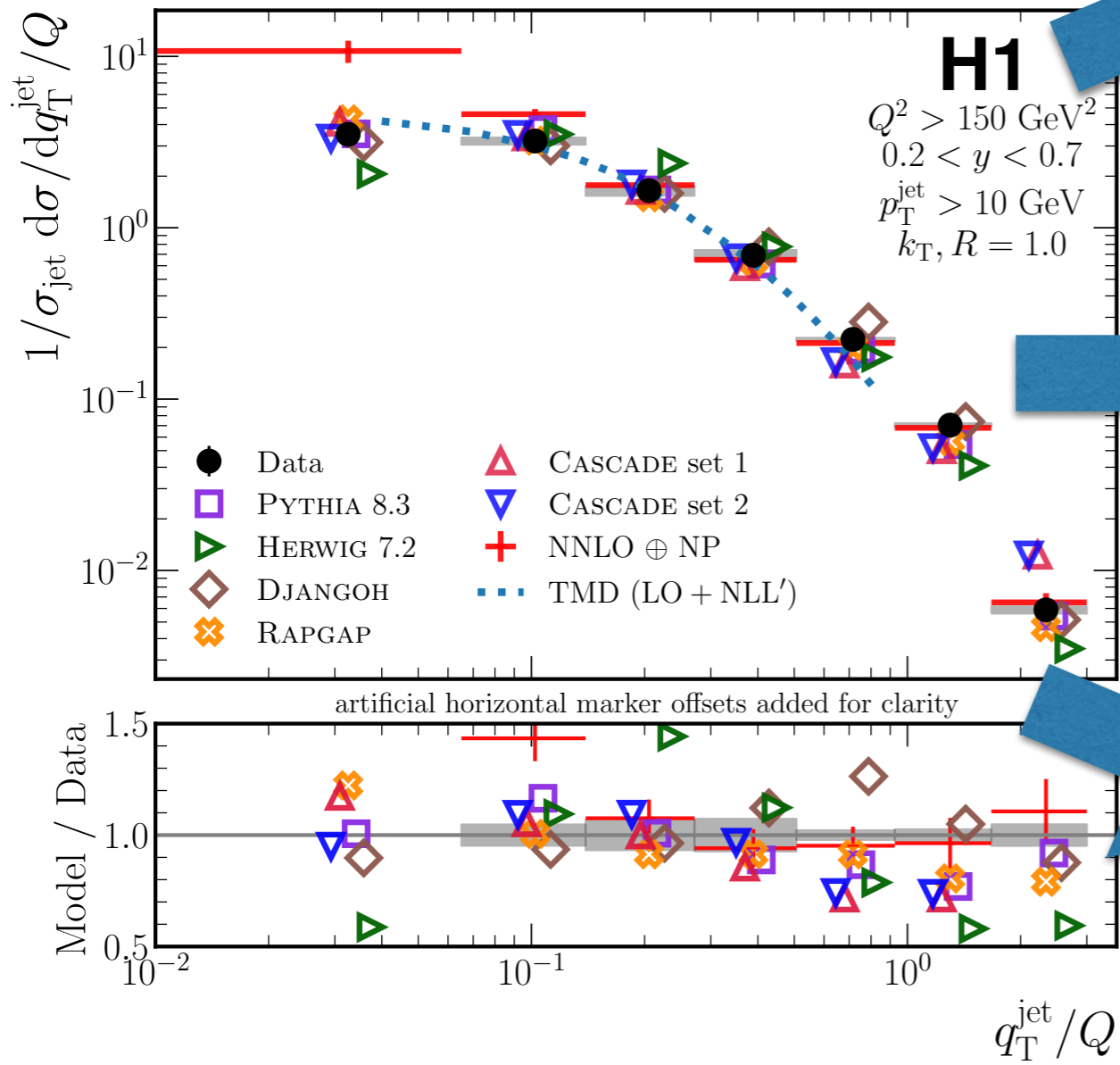
H1 Collaboration

#### **Abstract**

The lepton-jet momentum imbalance in deep inelastic scattering events offers a useful set of observables for unifying collinear and transverse-momentum-dependent frameworks for describing high energy Quantum Chromodynamics (QCD) interactions. We recently performed a measurement of this imbalance in the laboratory frame using positron-proton collisions from HERA Run II [1]. With a new machine learning method, the measurement was performed simultaneously and unbinned in eight dimensions. The results in Ref. [1] were presented projected onto four key observables. This paper extends those results by showing the multi-differential nature of the unfolded result. In particular, we present lepton-jet correlation observables differentially in kinematic properties of the scattering process,  $Q^2$  and  $y$ . We compare these results with parton shower Monte Carlo predictions as well as calculations from perturbative QCD and from a Transverse Momentum Dependent (TMD) factorization framework.

# Results

*Differential in  $Q^2$  for free!*



H1prelim-23-031

## **Machine learning-assisted measurement of azimuthal angular asymmetries in deep-inelastic scattering with the H1 detector**

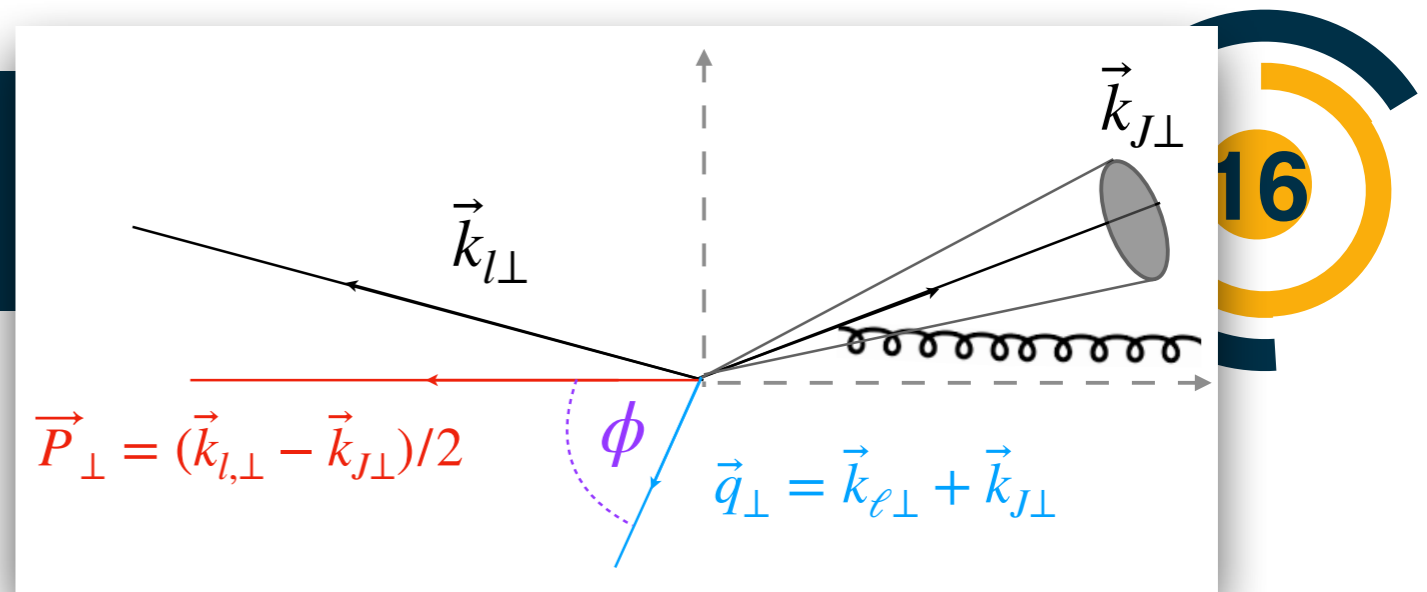
H1 Collaboration

### **Abstract**

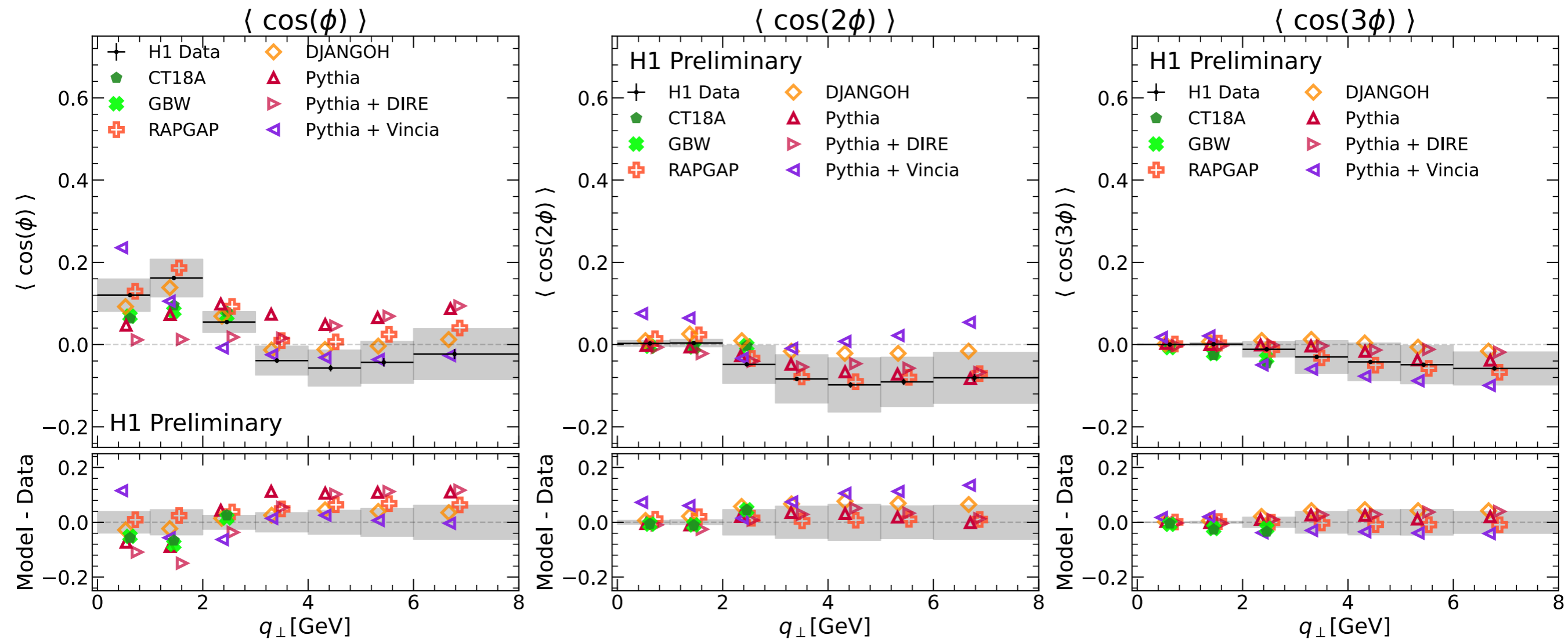
Jet-lepton azimuthal asymmetry harmonics are measured in deep inelastic scattering data collected by the H1 detector using HERA Run II collisions. When the average transverse momentum of the lepton-jet system,  $|\vec{P}_\perp|$ , is much larger than the total transverse momentum of the system,  $|\vec{q}_\perp|$ , the asymmetry between  $\vec{P}_\perp$  and  $\vec{q}_\perp$  is expected to be generated by initial and final state soft gluon radiation and can be predicted using perturbation theory. Quantifying the angular properties of the asymmetry therefore provides a novel test of the strong force and is also an important background to constrain for future measurements of intrinsic asymmetries generated by the proton's constituents through Transverse Momentum Dependent (TMD) Parton Distribution Functions (PDF). Moments of the azimuthal asymmetries are measured using a machine learning technique that does not require binning and thus does not introduce discretization artifacts.

# Results

Probe soft gluon radiation  
(as a background to TMDs)



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N.B. Pythia not tuned to these data!

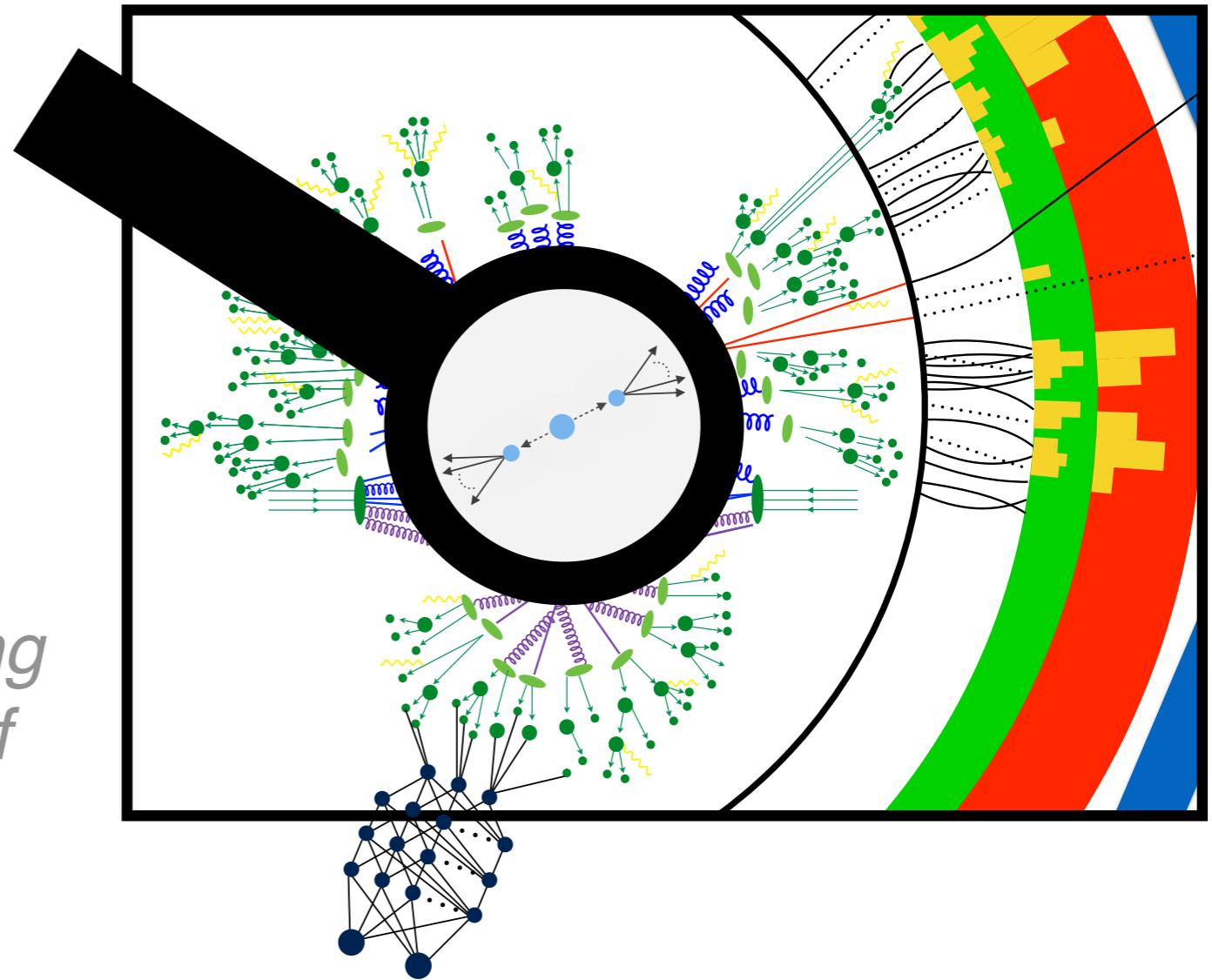


# Conclusions and outlook

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Today, I have presented  
(reused) ML-based  
unfolding for studying  
lepton-jet asymmetries.

*This is the beginning of an exciting  
program to advance our study of  
QCD into higher dimensions!*



These particular measurements are exciting in their own right and provide a pilot program for the EIC.

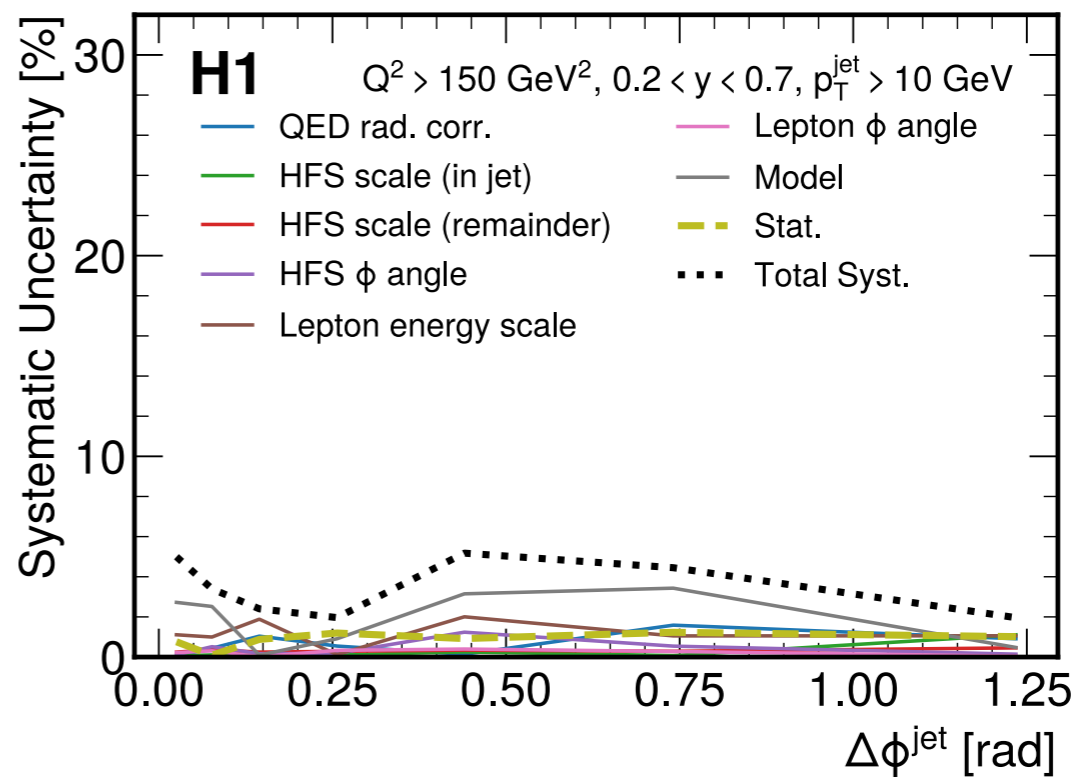
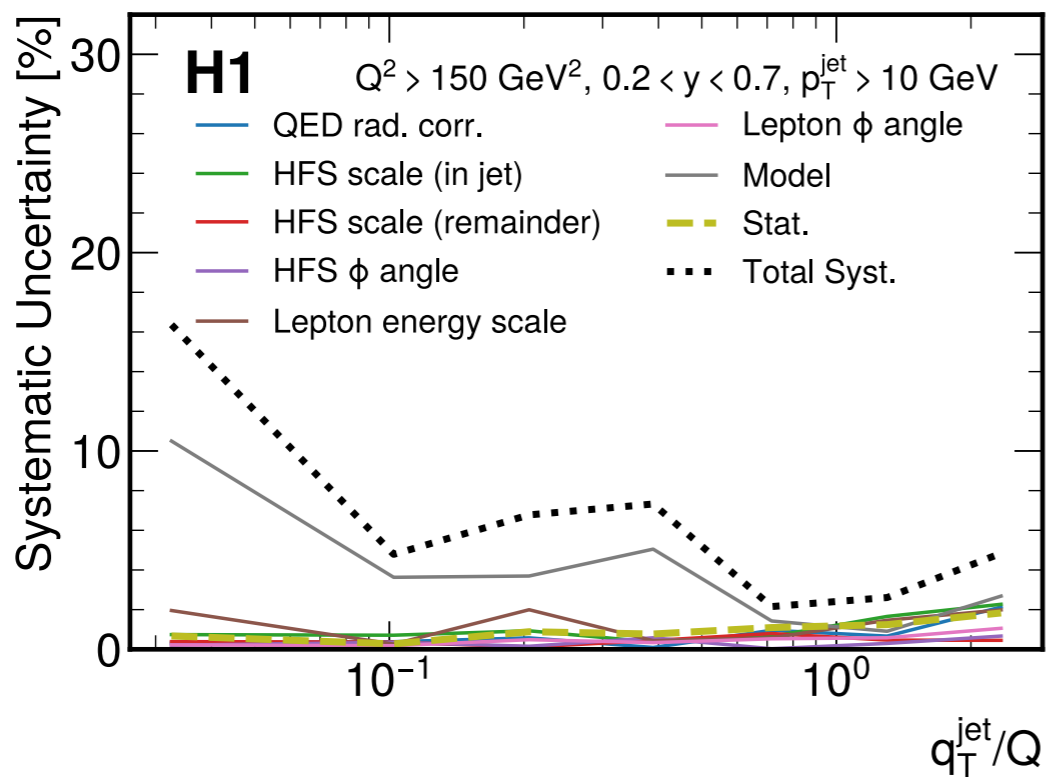
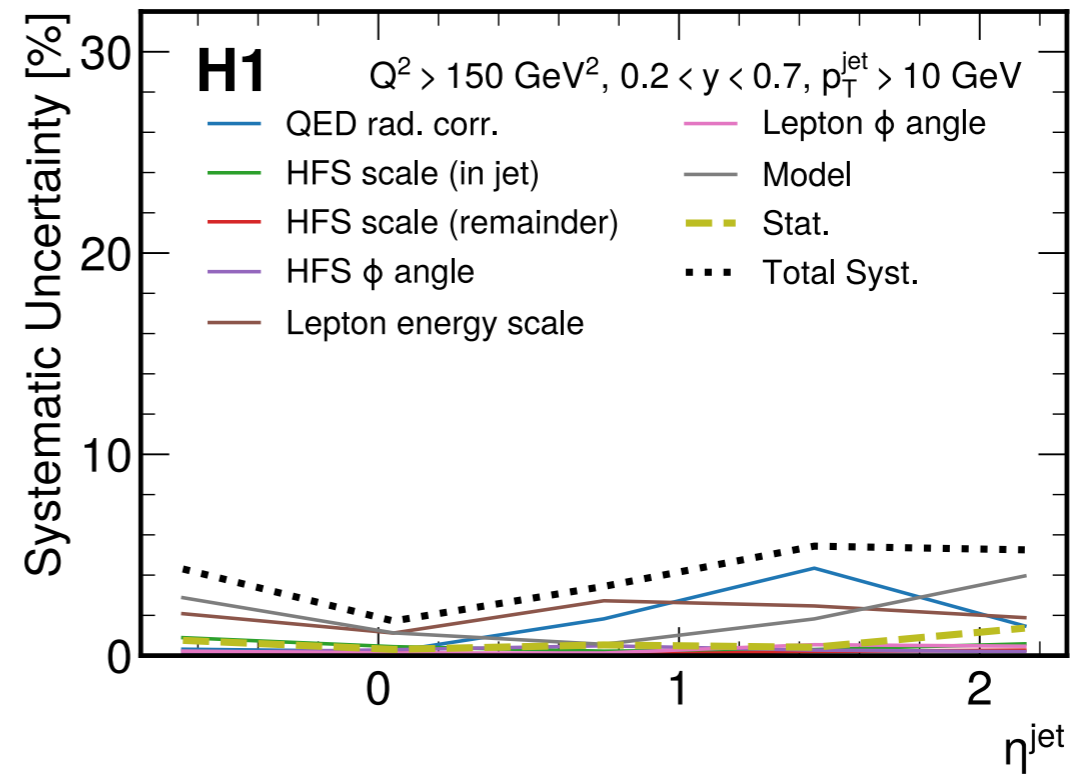
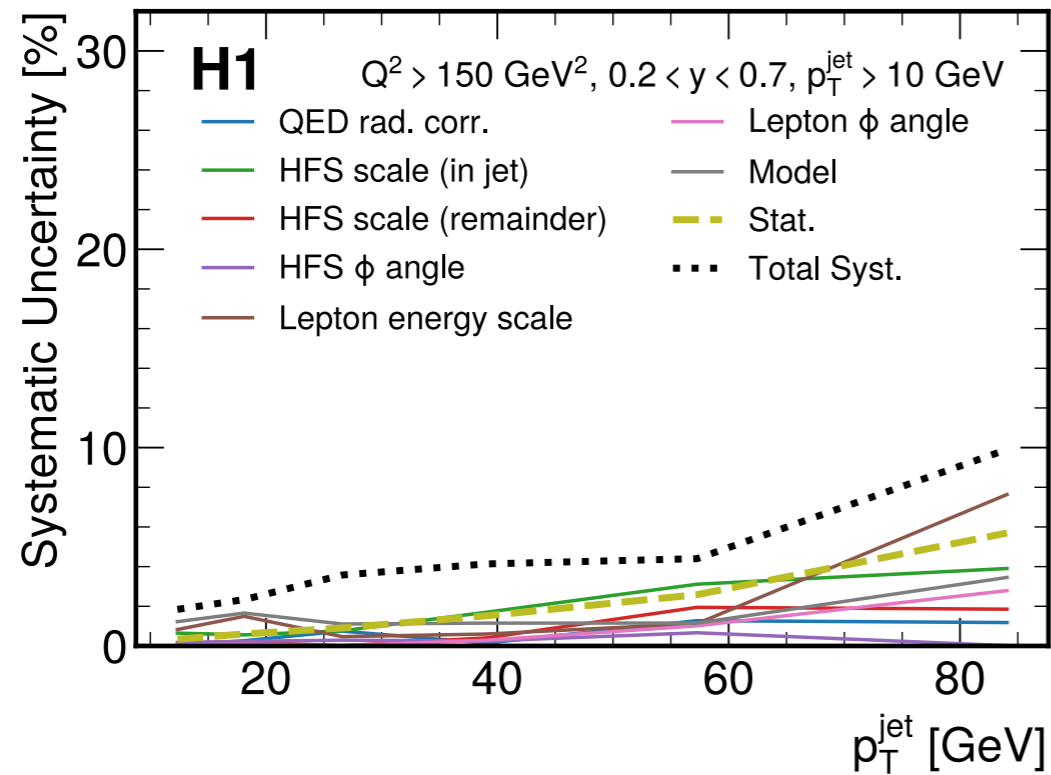
# Backup

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See also [this talk](#) by Fernando Torales Acosta!

# Results

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# Results



Simultaneous for free!  
(binning is for illustration)

**H1**  
Stat. Uncertainty  $Q^2 > 150 \text{ GeV}^2$   
 $0.2 < y < 0.7$   
 $p_T^{\text{jet}} > 10 \text{ GeV}$   
 $k_T, R = 1.0$

