

# Measurement of jet substructure observables using the ATLAS detector

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on behalf of the ATLAS Collaboration

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# Outlook

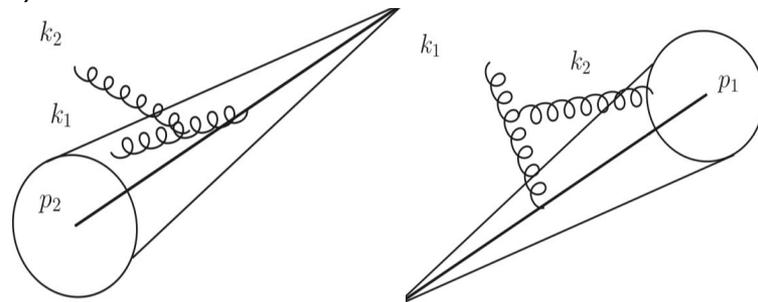
- **The Soft Drop algorithm**
- **Measurement of the soft-drop jet mass**
- **Measurement of substructure variables in  $t\bar{t}$  and inclusive jet events**
- **New event generator configurations for the modelling of jet production**

# Jet substructure

- Jet substructure techniques are paramount to deal with boosted objects in the LHC
- New measurements of jet substructure are also solidifying our understanding of the internal structure of jets and the theory of QCD
  - $k_T$  splitting scales in  $Z \rightarrow ll$  events at 8 TeV with the ATLAS detector. (JHEP08 (2017) 26)
  - Colour flow using jet-pull observables in  $t\bar{t}$  events at 13 TeV. (Eur. Phys. J. C 78 (2018) 847)
  - **Soft-drop jet mass at 13 TeV. (Phys. Rev. Lett. 121, 092001)**
  - **Measurement of substructure variables in  $t\bar{t}$  and inclusive jet events. (arXiv:1903.02942)**
  - **Multijet simulation for 13 TeV ATLAS analyses. (ATL-PHYS-PUB-2019-017)**
- Non-negligible differences are observed between data and MC simulations
- Can constrain both analytic calculations in perturbative regime and soft-hadronic activity in non-perturbative region

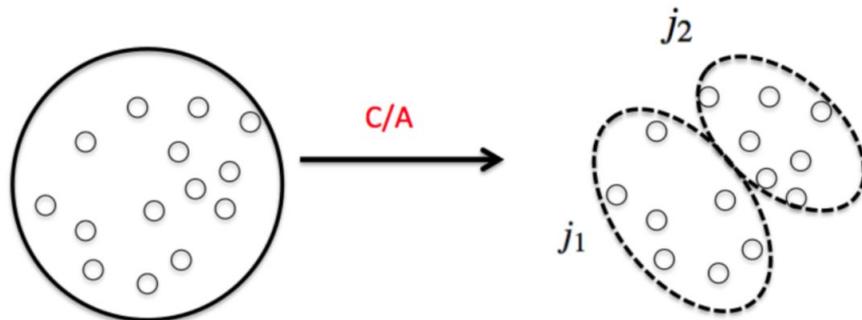
# Soft Drop

- Jet substructure tests QCD in a regime where a fixed-order is insufficient
  - Sensitive to soft and collinear radiation
- A precise analytic calculation of substructure variables (beyond leading log) not possible due to the presence of non-global logarithmic resummation terms (NGLs).
  - Related to particles radiating out of and then into jet
- A perfect example is jet mass
- Soft drop. JHEP 1405 (2014) 146
  - Jet grooming procedure that removes energy related to soft parton emission and pile-up
  - Formally insensitive to NGLs
- The distribution of the soft-drop mass has now been calculated at
  - NLO with NLL. JHEP07(2016)064
  - LO with NNLL. JHEP07(2017)132



# The Soft Drop algorithm

- Take a jet, re-cluster its constituents with C/A, and go backwards in the C/A clustering sequence



- If  $\frac{\min(p_{T,1}, p_{T,2})}{p_{T,1} + p_{T,2}} > z_{cut} \left( \frac{\Delta R_{12}}{R} \right)^\beta$  then the jet is a soft drop jet.
- Otherwise, the highest  $p_T$  sub-jet is taken as a new candidate and the procedure is iterated.
- $z_{cut}$  sets the scale of energy removal. Higher  $z_{cut}$  means more energy removed by grooming.
- $\beta$  determines the sensitivity to wide-angle radiation.
  - Larger  $\beta$  means smaller fraction of soft small-angle radiation removed -> less grooming.

# ATLAS measurement of the soft-drop jet mass

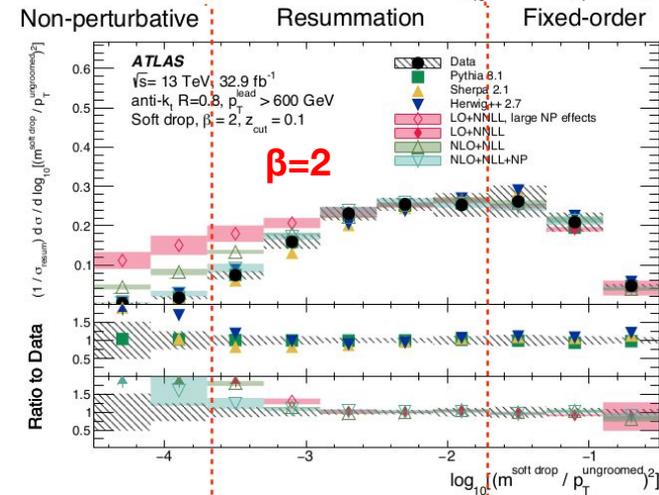
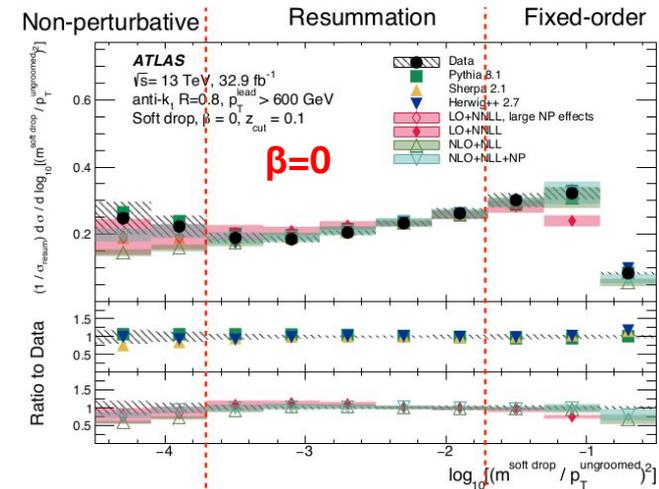
Phys. Rev. Lett. 121, 092001 (2018)

# Soft-drop jet mass measurement

- Using anti- $k_T$   $R=0.8$  jets built from locally calibrated calorimeter-cell clusters
- Lowest un-prescaled trigger (400 GeV) and  $p_{T,1} > 600$  GeV
- Dijet topologies:  $p_{T,1}/p_{T,2} < 1.5$  for two leading jets
- Measuring dimensionless mass parameter,  $\rho = m_{\text{softdrop}} / p_T^{\text{ungroomed}}$ 
  - Weak dependence on  $p_T$
  - Distribution of  $\log_{10}(\rho^2)$  studied for  $\beta = 0, 1, 2$  and  $z_{\text{cut}} = 0.1$
- Simultaneously unfolding in  $\log_{10}(\rho^2)$  and jet  $p_T$  distributions using Pythia LO predictions
- Three distinct regions
  - Non-perturbative region:  $\log_{10}(\rho^2) < -3.7$  (soft and collinear emissions)
  - Resummation region:  $-3.7 < \log_{10}(\rho^2) < -1.7$  (resummation dominates)
  - Fixed-order region:  $\log_{10}(\rho^2) > -1.7$  (wide-angle hard gluon emissions)

# Results

- Distributions normalised to data in resummation region
- MC generators do an excellent job of describing data over entire mass range
- Good agreement between data and analytic calculations in resummation and fixed-order regions
- Largest difference between MC and analytic predictions in non-perturbative regime
  - Effect larger for higher  $\beta$  (smaller fraction of soft energy removed)
- Including non-perturbative effects improves the accuracy of the NLO+NLL prediction



# **ATLAS measurement of jet-substructure observables in $t\bar{t}$ and inclusive jet events**

arXiv:1903.02942

# Overview

- JSS variables are used extensively for top/W/Z and Higgs tagging
- No ATLAS unfolded measurement of variables at 13 TeV
- Useful for MC model and tagger developments
- A set of softdrop-groomed variables can be calculated analytically
  - strong theoretical motivation
- Large-radius jet substructure for: W, top, and light quark jets!
  - Semi-leptonic selections for W and top jets in  $t\bar{t}$  events
  - Dijet selection for light quark jets in QCD events
- 8 observables for top, W and QCD jets

# Observables

- **(generalised) N-subjetiness**

$$\tau_N^{(\beta)} = \frac{1}{d_0} \sum_i p_{Ti} \min \left\{ (\Delta R_{1,i})^\beta, (\Delta R_{2,i})^\beta \dots (\Delta R_{N,i})^\beta \right\}$$

- A set of N subjet axis are defined using the exclusive  $k_t$  algorithm.

- **Normalised energy correlation functions (and ratios)**

$$e_2^\beta = \frac{1}{p_{TJ}^2} \sum_{i < j \in J} p_{Ti} p_{Tj} R_{ij}^\beta \quad e_3^\beta = \frac{1}{p_{TJ}^3} \sum_{i < j < k \in J} p_{Ti} p_{Tj} p_{Tk} R_{ij}^\beta R_{jk}^\beta R_{ik}^\beta$$

- Subjet-independent way to discriminate between a “two-pronged” jet and a single prong parton initiated jet.

- Ratio of energy correlation functions:  $D_2^\beta = \frac{e_3^\beta}{(e_2^\beta)^3}, C_2^\beta = \frac{e_3^\beta}{(e_2^\beta)^2}$

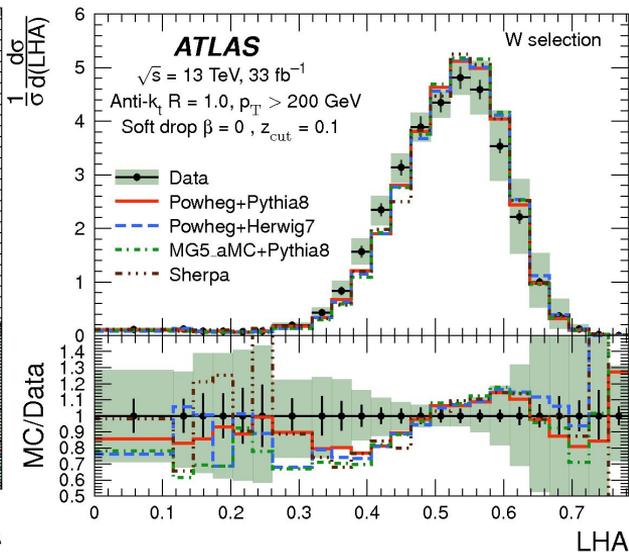
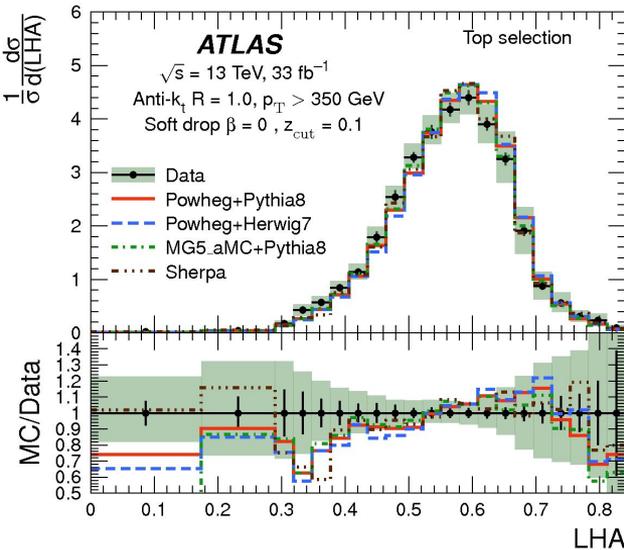
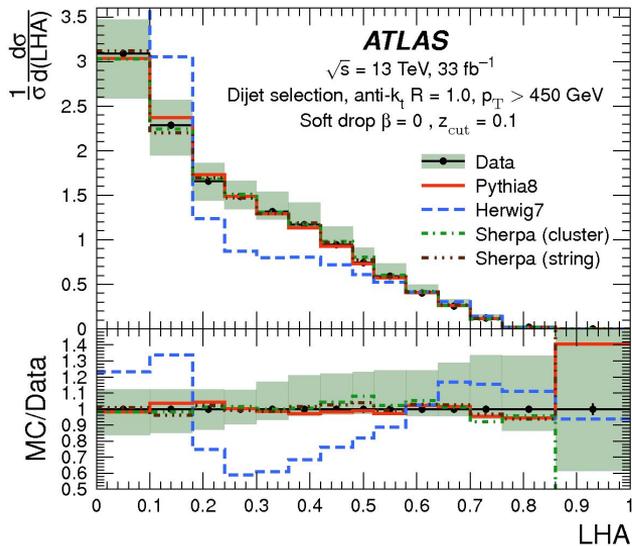
- **Les Houches angularity (LHA)**

- Used in various quark/gluon discrimination studies with  $\kappa=1$  and  $\beta = 0.5$

$$\lambda_\beta^\kappa = \sum_{i \in \text{jet}} \left( \frac{p_{Ti}}{\sum_{i \in \text{jet}} p_{Ti}} \right)^\kappa \left( \frac{R_{i\hat{n}}}{R} \right)^\beta$$

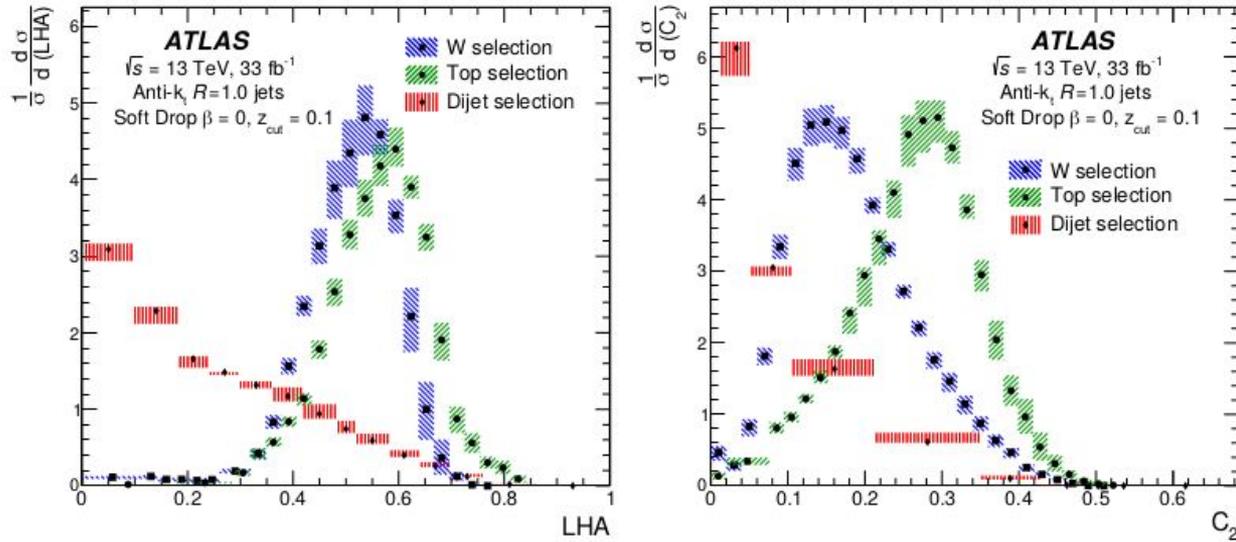
# Results

- Unfolded to particle level with Bayesian method



- Pythia8 does best for light quark/gluon observables
- Herwig7 very different from data
- No meaningful differences seen between different hadronization models used in Sherpa
- Shifted peak suggest excess gluon radiation in predictions

# Results



- Important discrimination for BSM physics tagging
- Clear differences in boosted jet shapes and substructures
- Detailed measurements and MC tuning essential for optimizing physics performance of both measurements and searches

# Multijet simulation for 13 TeV ATLAS Analyses

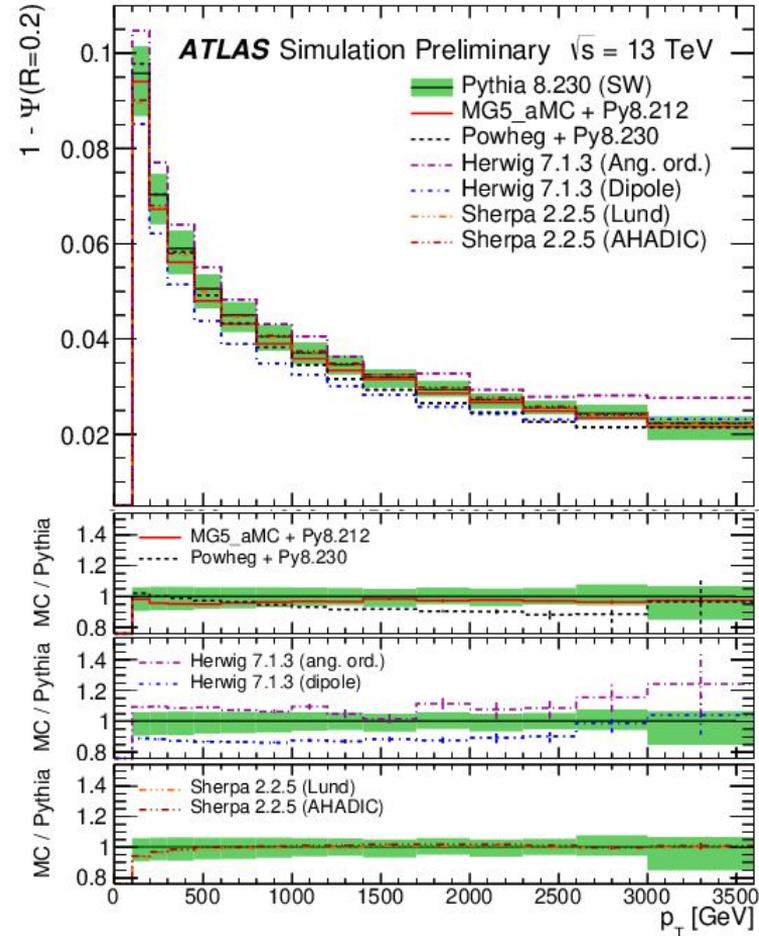
ATL-PHYS-PUB-2019-017

# Overview

- Measurement of the inclusive jet spectrum at 13 TeV
  - provide interesting inputs for the understanding of basic physics modelling features such as the parton shower or the hadronization model
- Measurement in distributions of global event observables and [jet substructure](#) variables
- Compared to different MC samples:
  - Pythia 8.230
  - Madgraph + Pythia 8.212
  - Herwig 7.1.3
    - PS: angular-ordered and dipole
  - Powheg + Pythia 8.230
  - Sherpa 2.2.5
    - Hadronization: cluster fragmentation (AHADIC) and string fragmentation (Lund)
- For this analysis, all jets ( $R=0.4$ ) fulfilling  $p_T > 100$  GeV and  $|\eta| < 2.5$  are considered.

# Results

- Fraction of  $p_T$  in the outer band of the jets ( $r=0.2$ )
  - The green bands show the PS uncertainties for Pythia
  - The vertical error bars represent the stat. uncertainties
- MG5\_aMC@NLO and Powheg predict narrower jets than Pythia 8
  - but compatible within the Pythia 8 shower uncertainties
- Herwig:
  - dipole parton shower predicts systematically narrower jets than Pythia 8
  - angular-ordered showers give, on average, wider energy distributions inside the jet cone
- Both Sherpa samples provide a very similar prediction to that of Pythia 8



# Conclusions

- Jet substructure studies are essential to find new physics in post-Higgs era
- Proper estimation of uncertainties, and robustness against pile-up is critical
- Need measurements, and best possible MC modeling

Presented recent ATLAS measurements of substructure observables

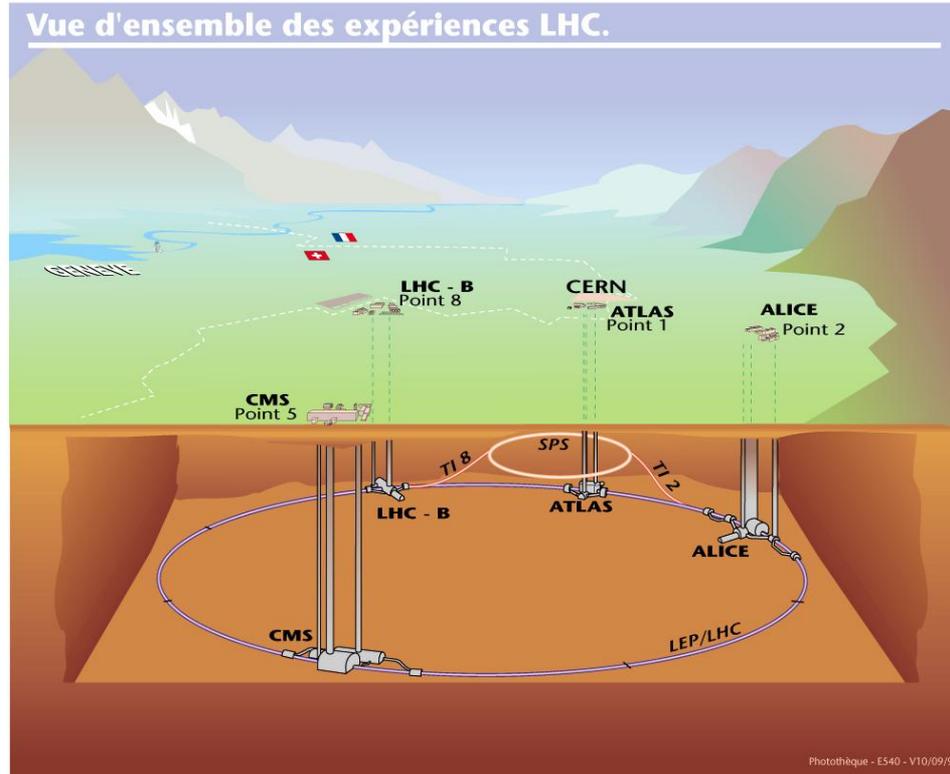
- **Soft-drop jet mass at 13 TeV.** (Phys. Rev. Lett. 121, 092001)
  - Good agreement between data and calculations in resummation and fixed-order regions
  - MC generators do better in non-perturbative region
  - Results to be used to constrain future calculations and MC generator predictions
- **Measurement of jet substructure observables at 13 TeV.** (arXiv:1903.02942)
  - Uncertainties small enough to have discriminating power between the various MC models
    - useful to improve modeling
  - Help understand limitations of searches with boosted topologies
  - Improve the design and performance of tagging algorithms
- **Multijet simulation for 13 TeV ATLAS Analyses.** (ATL-PHYS-PUB-2019-017)
  - Significant differences in the description of substructure observables such as the jet mass found at low  $p_T$  in both hadronization models implemented in Sherpa.
  - Both Herwig samples give very different descriptions of the jet shapes
    - the dipole parton shower giving significantly wider jets than the angular-ordered counterpart

# Thanks

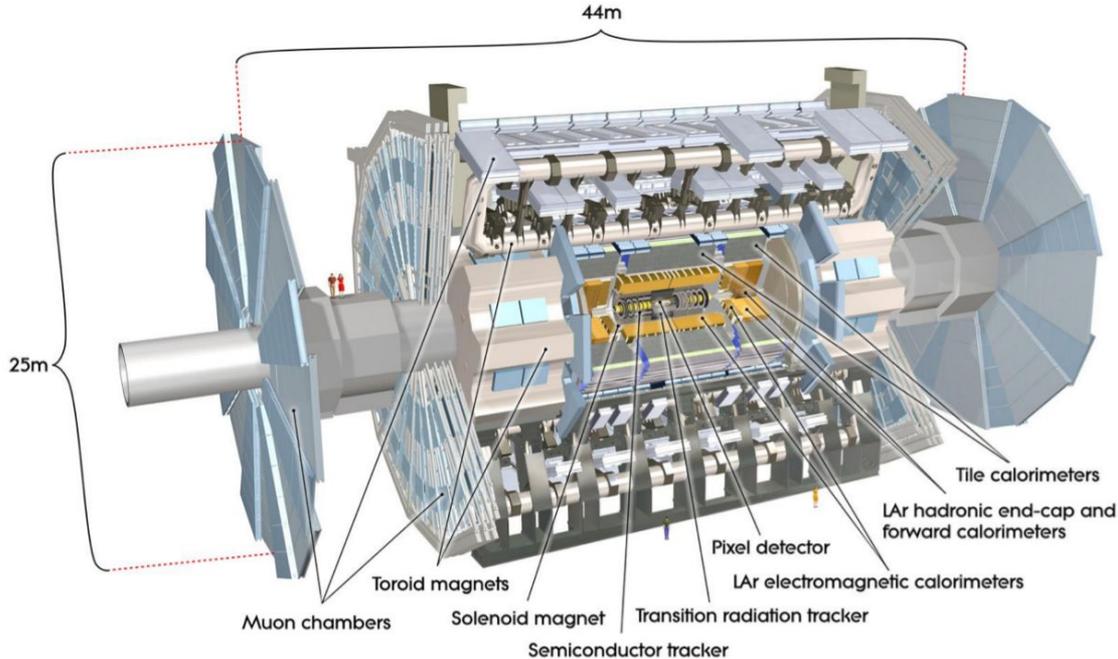


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# The Large Hadron Collider (LHC)

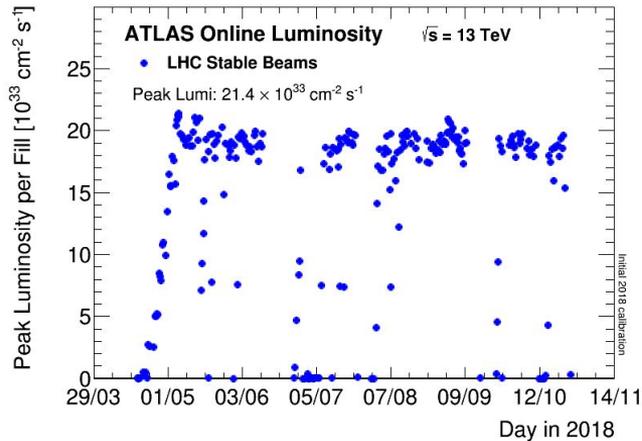


# The ATLAS detector

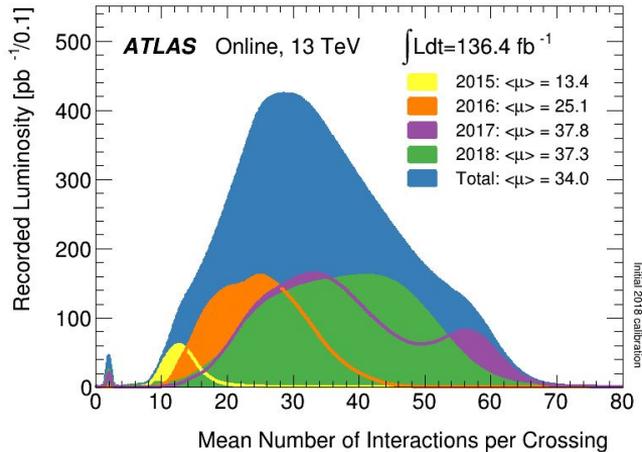


- **A Toroidal LHC Apparatus**
  - 44 m long, 25 m of diameter
  - 4 layers of detectors
- Inner detector
  - pixel, strip, TRT
- Electromagnetic calorimeter
- Hadronic calorimeter
- Muon detector

# LHC and ATLAS performance

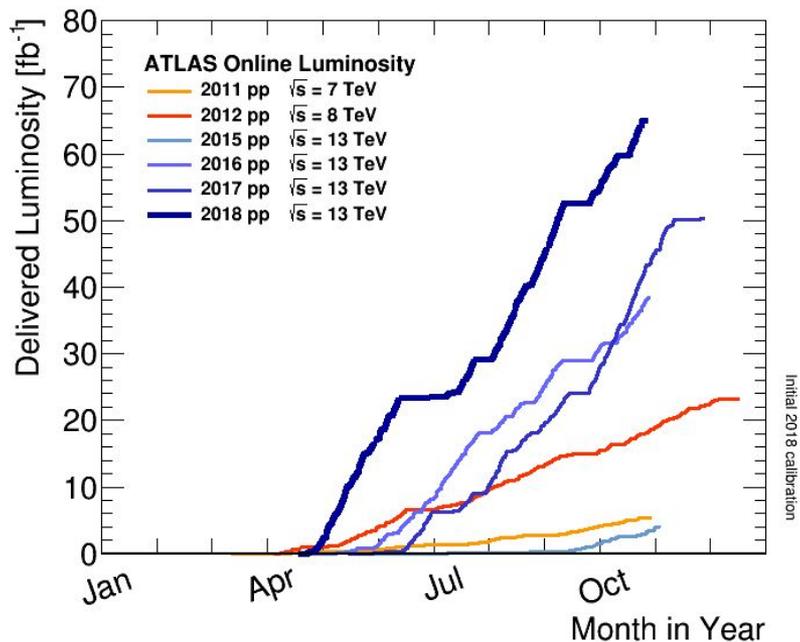


- At LHC two bunches of protons collide every 25 ns (40 MHz)
- LHC design instantaneous luminosity:  $10^{34} \text{ cm}^{-2} \text{ s}^{-1}$



- Hard collisions -> between two elementary components of the protons (q or g)
- Other components of the same hadrons produce “underlying event”
- Several collision events per proton bunch crossing “pile-up events”

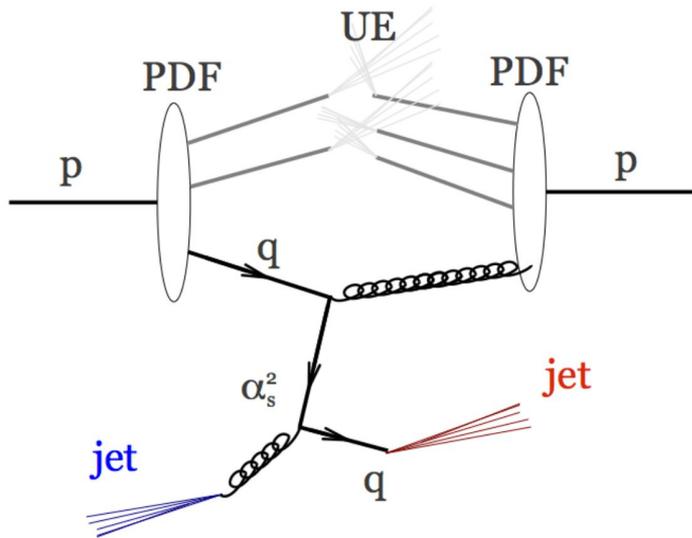
# LHC and ATLAS performance



- Current center of mass energy  $\sqrt{s}=13 \text{ TeV}$
- Originally expected to get up to  $120 \text{ fb}^{-1}$  by the end of 2018
- $\sim 160 \text{ fb}^{-1}$  (!! ) of proton-proton collision data registered by ATLAS in Run-II

# What is a jet?

- At short distances quarks and gluons move as quasi-free particles (asymptotic freedom)
- When they are energetic, they produce bremsstrahlung cascades of gluons and  $q\bar{q}$  pairs, which then hadronise
- We see jets of tightly collimated hadrons



- There are a lot at the LHC! (dominant high  $p_T$  process)
- Jet properties reflect those of the quarks and gluons which originated them
- A good handle to test the QCD sector of the SM over several orders of magnitude
  - Proton structure (PDF)
  - Strong coupling constant,  $\alpha_s$
  - Perturbative QCD effects
  - Fragmentation/Hadronization effects

# Jet reconstruction

- Sequential recombination algorithms most popular in the LHC era (G. Salam, arXiv:0906.1833)
- Collinear and infrared safe!
- The clustering inverts the parton shower by combining the constituents of the jet according to subsequent 'distance' criteria

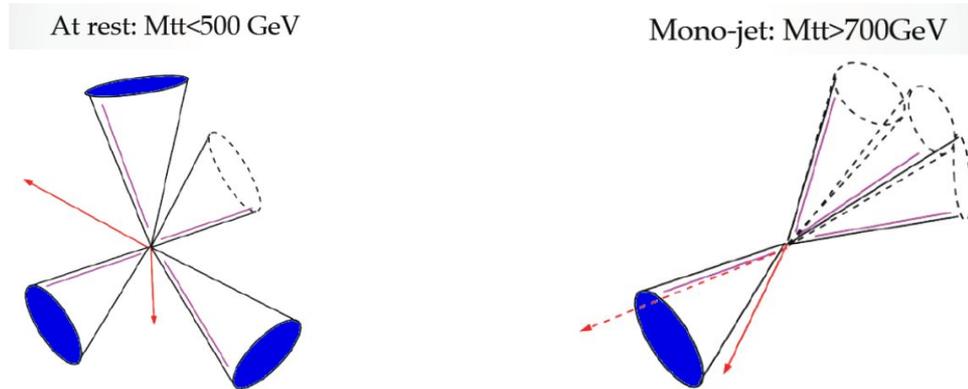
$$d_{ij} = \min(p_{Ti}^{2n}, p_{Tj}^{2n}) \times \frac{\Delta R_{i,j}^2}{R^2}$$

$$d_{iB} = p_T^{2n}$$

- Inclusive jet reconstruction: clustering continues until the minimum distance is found to be  $d_{iB}$
- **(n=1)  $k_t$** : Softest pair of constituents clustered first. Follows IR and collinear splittings.
- **(n=0) Cambridge-Aachen (C/A)**: Closest pair of constituents clustered first. Mimics angular-ordered parton shower.
- **(n=-1) anti- $k_t$** : Hardest constituent clustered with closest neighbour. Regularly shaped jets.

# Jet substructure

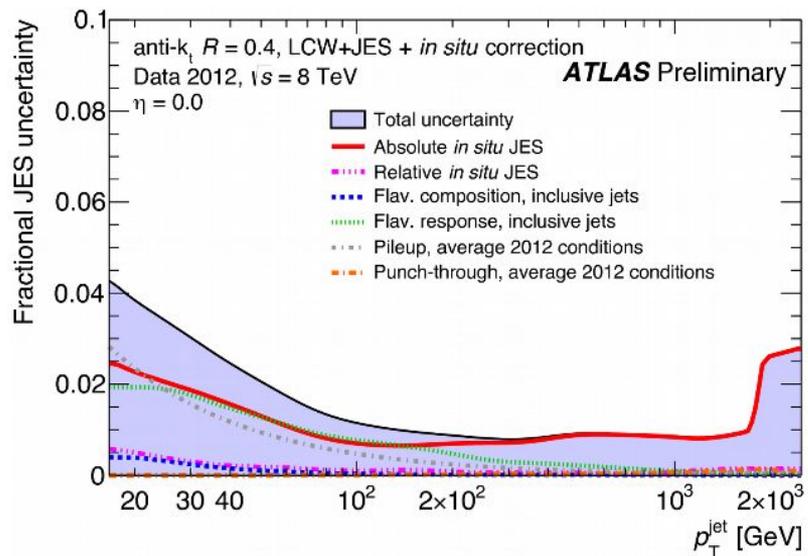
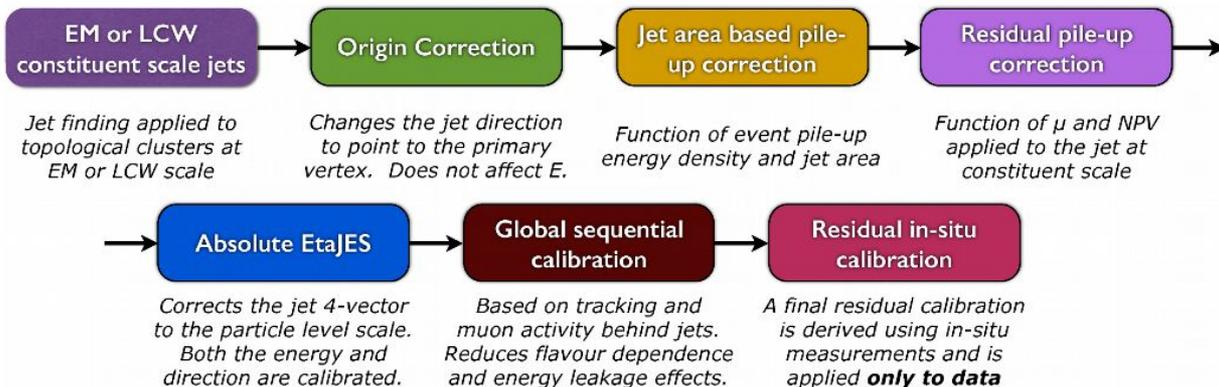
- Classical “resolved” algorithms run into problems for highly boosted final states
- A large radius jet of  $R > 2m/p_T$  can contain all decay products of a given particle
  - Top quark, Higgs/W/Z bosons, new heavy particles ...



- Internal structure of the large  $R$  jet shows interesting features that can be used to identify the origin of the jet
  - distinguish multi-jet background from signals

# Jets in ATLAS

- Jet production is the dominant high- $p_T$  process in the LHC
- Jet observables play an important role in the study of:
  - The structure of the proton
  - The color interaction and its coupling strength  $\alpha_s$
- Anti- $k_T$  jets
- Built considering topological clusters of calorimeter cells
- Clusters corrected for pileup prior to jet building
- Multi-stage calibration scheme
- Larger energy scale uncertainty than photons

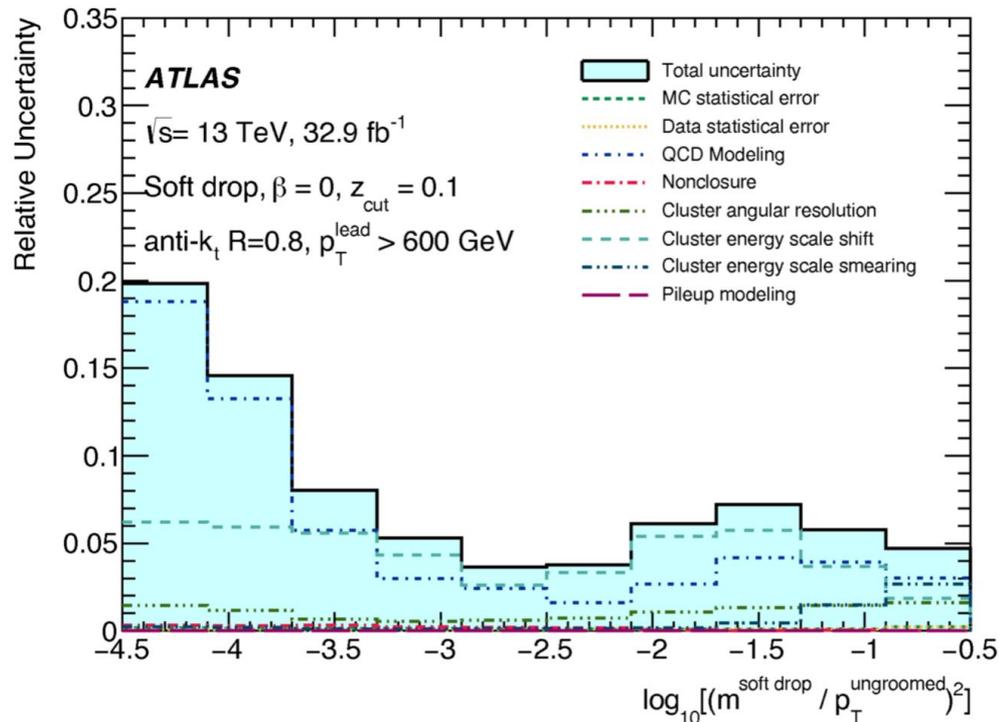


# ATLAS measurement of the soft-drop jet mass

Phys. Rev. Lett. 121, 092001 (2018)

# Uncertainties

- Many uncertainties cancel since  $\rho$  is a ratio
- QCD modeling uncertainties dominate
  - Particularly large at low mass where non-perturbative effects are largest
- Cluster energy uncertainties
  - Large at lower masses
    - Low cluster multiplicity
  - Also important at higher masses
    - Energy of hard prongs dominates the mass resolution instead of the opening angle
- Other uncertainties are subdominant
  - Pile-up negligible as expected

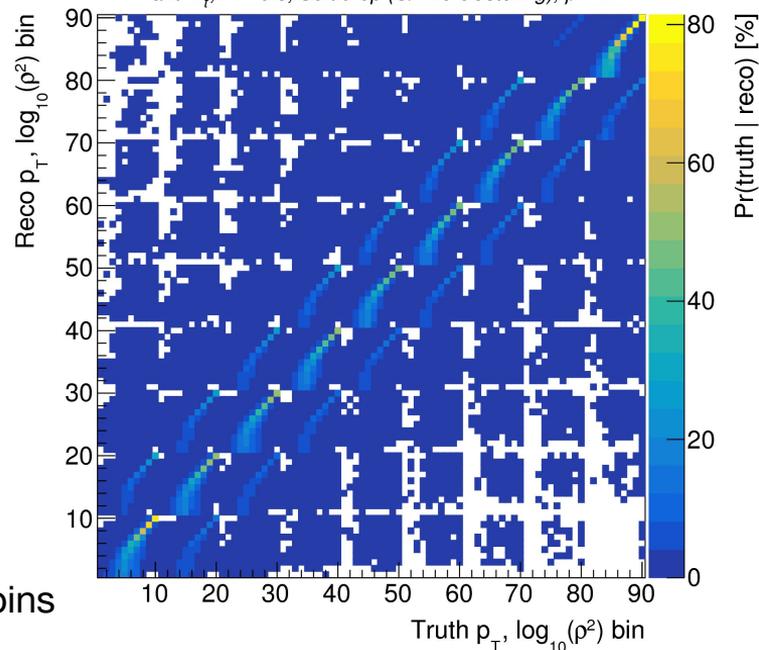


# Unfolding

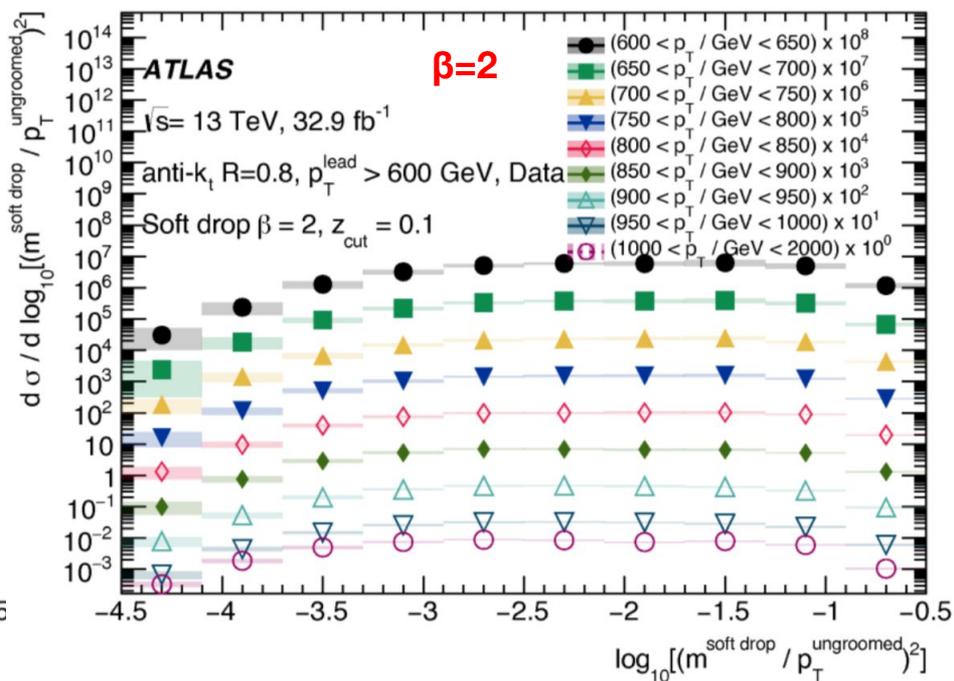
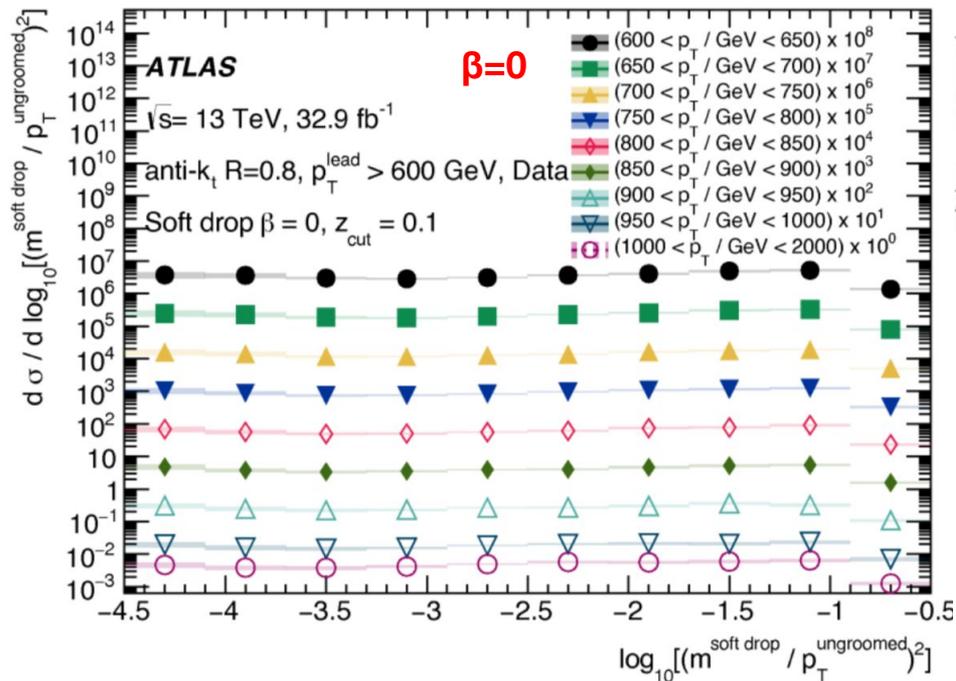
- Pythia used as nominal
  - Sherpa and Herwig++ to evaluate uncertainty
- Particle-level selection as close as possible to detector-level
  - Jets built using the same algorithm
  - Events must pass the same dijet requirement
  - Additional correction for the acceptance included
- $\log_{10}(\rho^2)$  and  $p_T$  unfolded simultaneously
- Example of response matrix for the combined  $p_T$  and  $\log_{10}(\rho^2)$  bins
  - Each group of 10 bins corresponds to a different  $p_T$  bin
  - Each bin within the  $p_T$  bin corresponds to 10 evenly spaced bins in  $\log_{10}(\rho^2)$
  - The bins are normalized so that the z-axis corresponds to the probability of a jet lying in a particular truth bin, given its reconstructed bin
- There are substantial migrations between the detector- and particle-level distributions, which cause large off-diagonal terms in the unfolding matrix especially at low values of  $\log_{10}(\rho^2)$

## ATLAS Simulation

anti- $k_T$ ,  $R = 0.8$ , Soft drop (C/A re-clustering),  $\beta = 2$

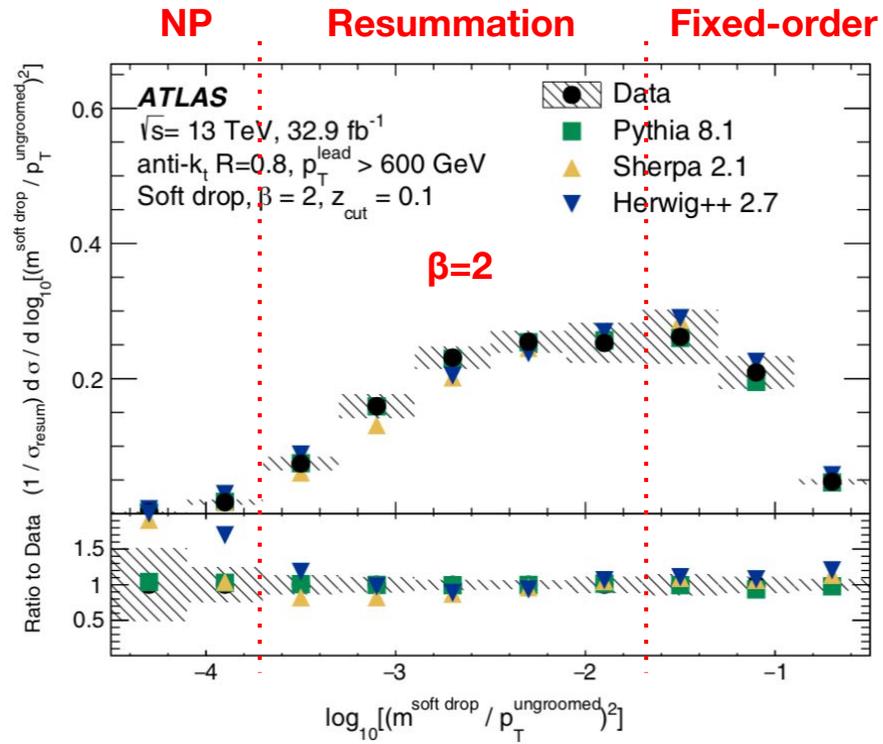
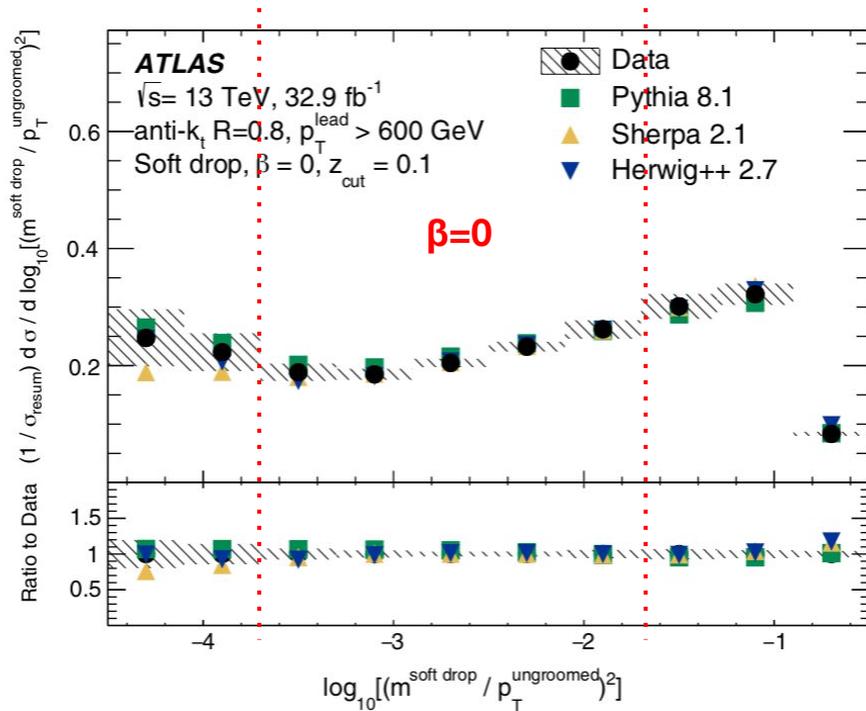


# Results: $\log_{10}(\rho^2)$ vs $p_T$



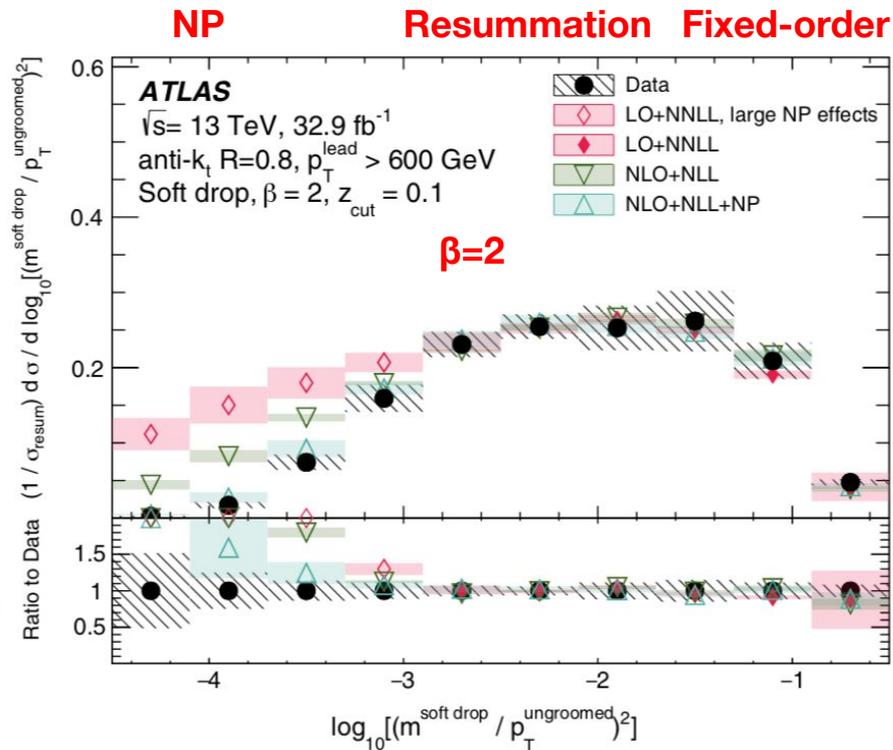
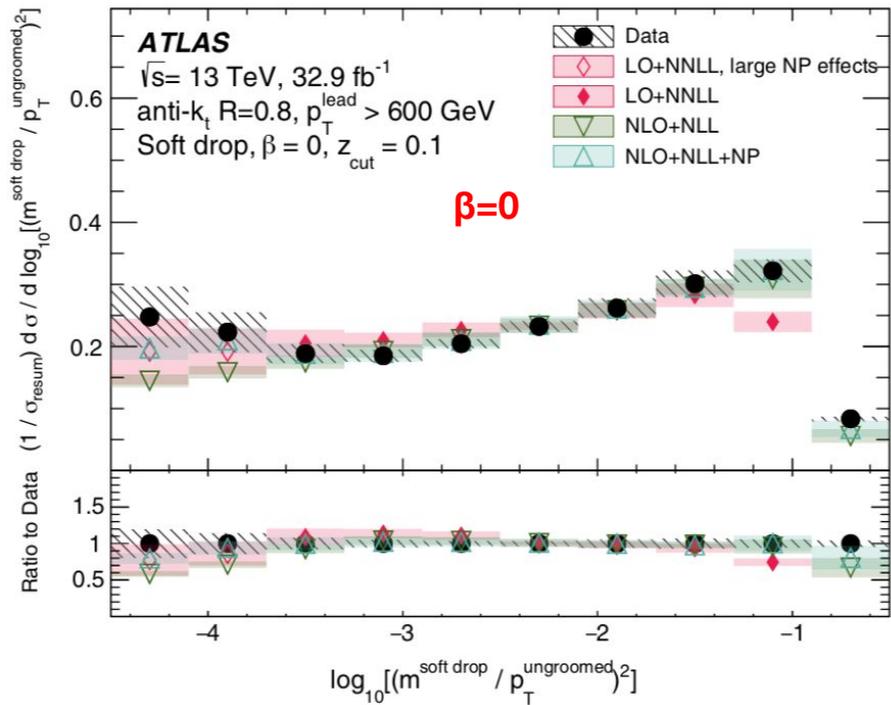
- $\log_{10}(\rho^2)$  for the  $p_T$  bins used in the analysis (from 600 GeV up to 2000 GeV)
- As expected, there is no strong dependence on  $p_T$

# Results



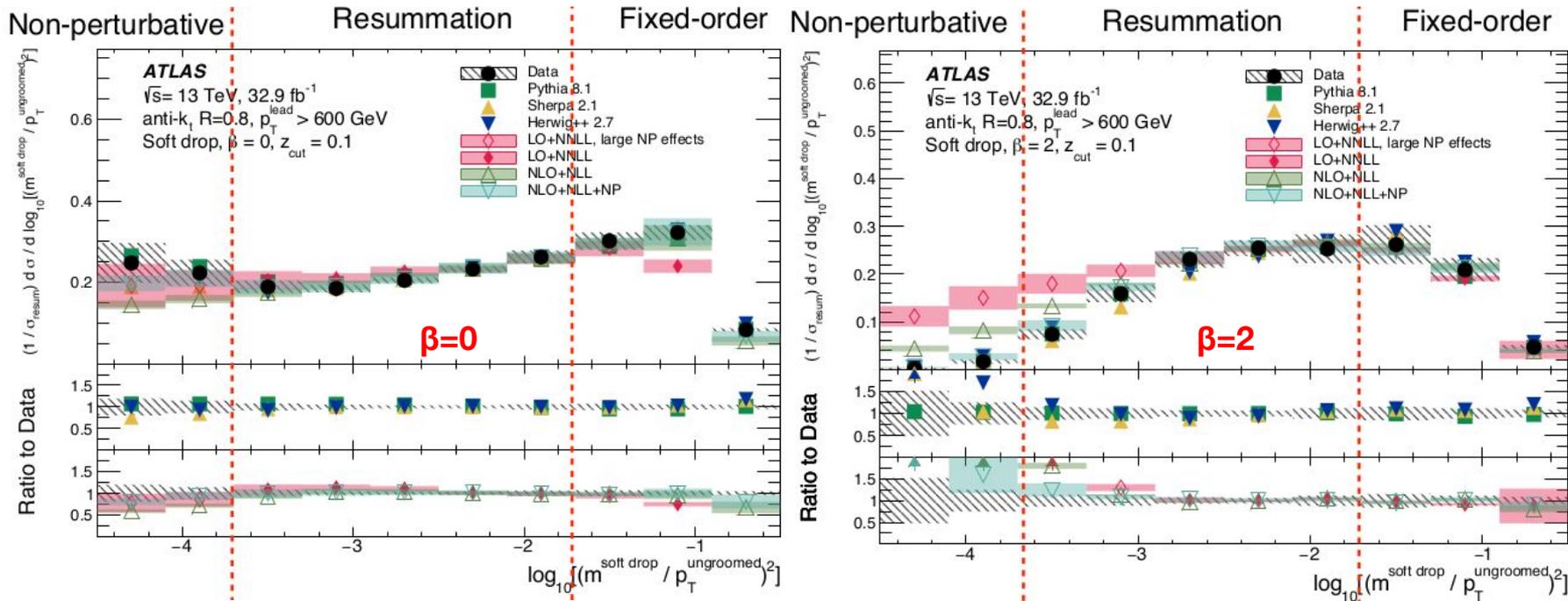
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# Results



- Good agreement between data and analytic calculations in resummation region
  - and fixed-order region for NLO calculations
- Including non-perturbative effects improves the accuracy of the NLO+NLL prediction

# Results



- Largest difference between data and MC/analytic predictions in non-perturbative regime
  - Effect larger for higher  $\beta$  (smaller fraction of soft energy removed)

# **ATLAS measurement of jet-substructure observables in $t\bar{t}$ and inclusive jet events**

arXiv:1903.02942

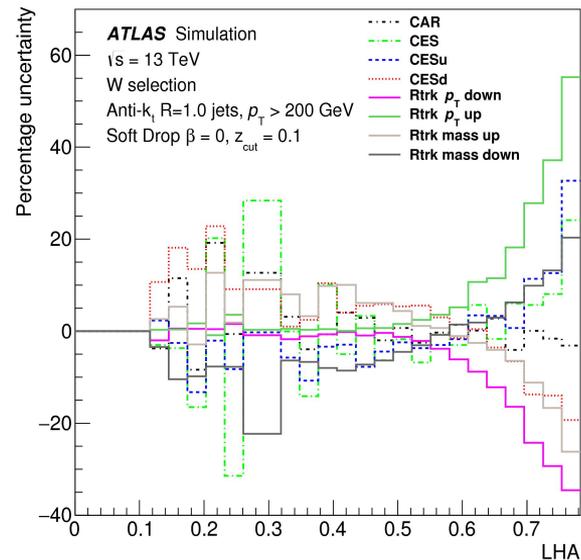
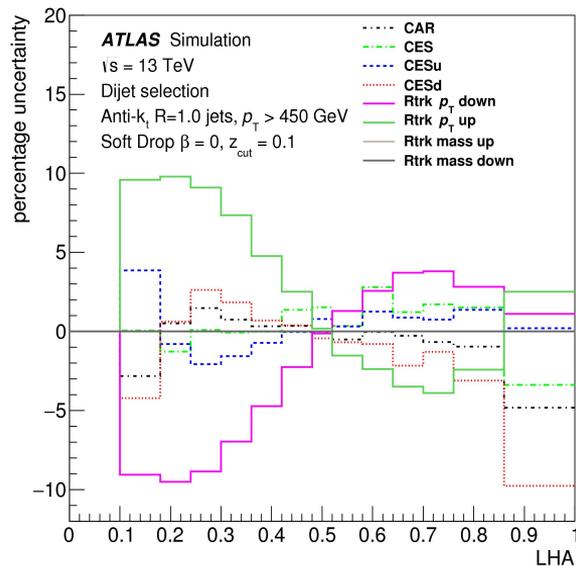
# Simulations

Process	Generator	Version	PDF	Tune	Use
Dijet	PYTHIA8 [27, 28]	8.186	NNPDF23LO [29]	A14 [30]	Nominal for unfolding
	SHERPA [31]	2.2.1	CT10 [32]	Default	Validation of unfolding (with two different hadronisation models)
	HERWIG7 [33]	7.0.4	MMHT2014	H7UE [33]	Comparison
$t\bar{t}$	POWHEG [34]	v2	NNPDF30NLO		Nominal for unfolding
	+ PYTHIA8	8.186	NNPDF23LO	A14	
	POWHEG	v2	CT10		Validation of unfolding
	+HERWIG++ [35]	2.7	CTEQ6L1	UE-EE-5 tune [36]	
	POWHEG	v2	CT10		Comparison
	+HERWIG7	7.0.4	MMHT2014	H7UE	
	MG5_aMC@NLO [37]	2.6.0	NNPDF30NLO		Comparison
	+ PYTHIA8	8.186	NNPDF23LO	A14	
Single top	SHERPA	2.2.1	CT10	Default	Comparison
	POWHEG	v1	CT10		Nominal for unfolding
	+ PYTHIA6 [38, 39]	6.428	CTEQ6L1 [32]	Perugia2012 [40]	
Z+jets	SHERPA	2.2.1	CT10	Default	Background estimation
W+jets	SHERPA	2.2.1	CT10	Default	Background estimation (nominal)
W+jets	MG5_aMC@NLO	2.2.5	CT10		Background estimation (cross-check)
	+ PYTHIA8	8.186	NNPDF23LO	A14	
Diboson	SHERPA	2.2.1	CT10	Default	Background estimation

# Selection

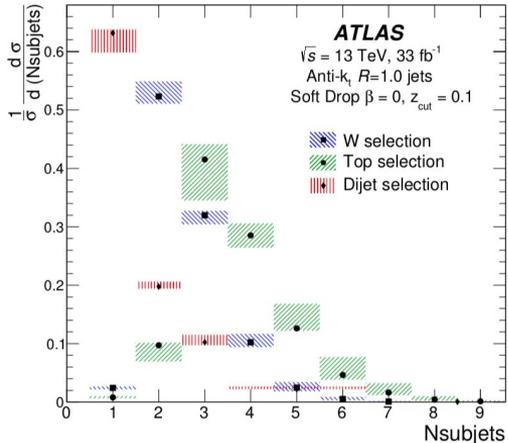
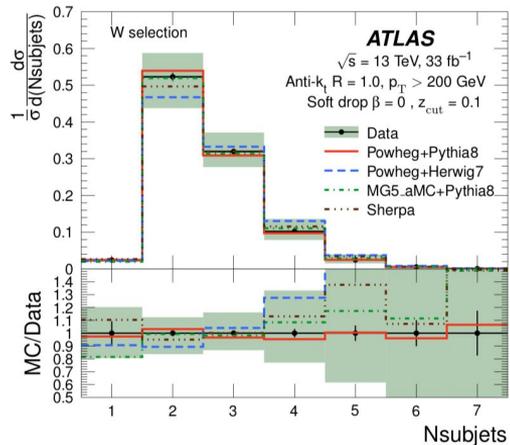
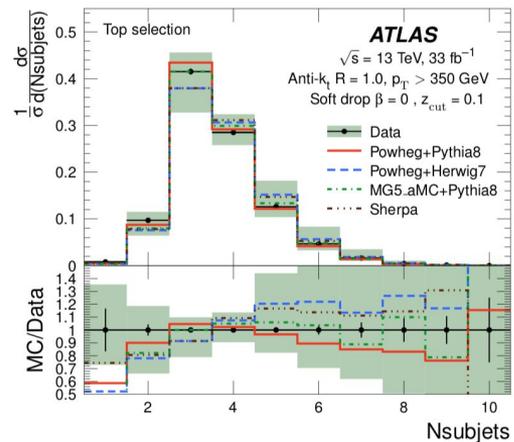
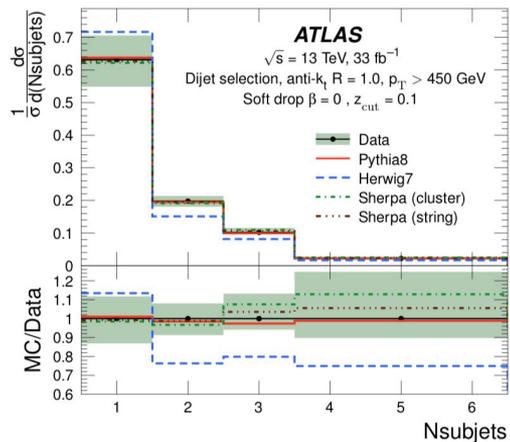
	Detector level	Particle level
Dijet selection:		
Two trimmed anti- $k_t$ $R = 1.0$ jets	$p_T > 200$ GeV $ \eta  < 2.5$	$p_T > 200$ GeV $ \eta  < 2.5$
Leading- $p_T$ trimmed anti- $k_t$ $R = 1.0$ jet	$p_T > 450$ GeV	
Top and $W$ selections:		
Exactly one muon	$p_T > 30$ GeV $ \eta  < 2.5$ $ z_0 \sin(\theta)  < 0.5$ mm and $ d_0/\sigma(d_0)  < 3$	$p_T > 30$ GeV $ \eta  < 2.5$
Anti- $k_t$ $R = 0.4$ jets	$p_T > 25$ GeV $ \eta  < 4.4$ JVT output $> 0.5$ (if $p_T < 60$ GeV)	$p_T > 25$ GeV $ \eta  < 4.4$
Muon isolation criteria	If $\Delta R(\mu, \text{jet}) < 0.04 + 10 \text{ GeV} / p_{T,\mu}$ : muon is removed, so the event is discarded	None
$E_T^{\text{miss}}, m_T^W$	$E_T^{\text{miss}} > 20$ GeV, $E_T^{\text{miss}} + m_T^W > 60$ GeV	
Leptonic top	At least one small-radius jet with $0.4 < \Delta R(\mu, \text{jet}) < 1.5$	
Top selection:		
Leading- $p_T$ trimmed anti- $k_t$ $R = 1.0$ jet	$ \eta  < 1.5$ , $p_T > 350$ GeV, mass $> 140$ GeV $\Delta R(\text{large-radius jet}, b\text{-tagged jet}) < 1$ $\Delta\phi(\mu, \text{large-radius jet}) > 2.3$	
$W$ selection:		
Leading- $p_T$ trimmed anti- $k_t$ $R = 1.0$ jet	$ \eta  < 1.5$ , $p_T > 200$ GeV, mass $> 60$ GeV and mass $< 100$ GeV $1 < \Delta R(\text{large-radius jet}, b\text{-tagged jet}) < 1.8$ $\Delta\phi(\mu, \text{large-radius jet}) > 2.3$	

# Uncertainties

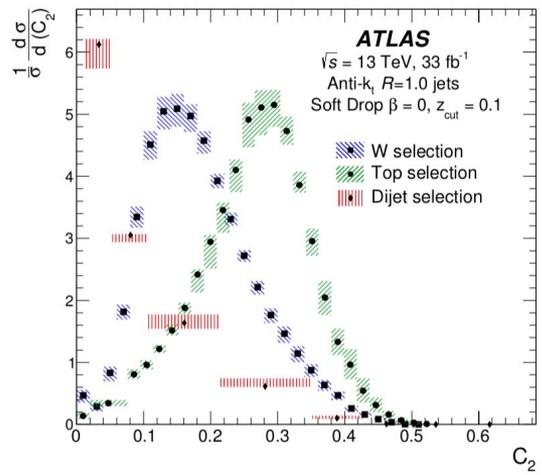
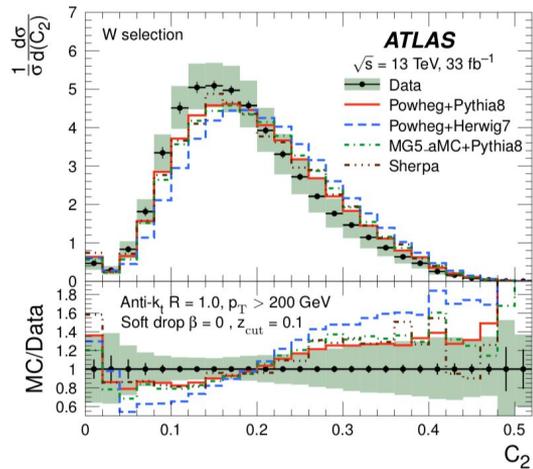
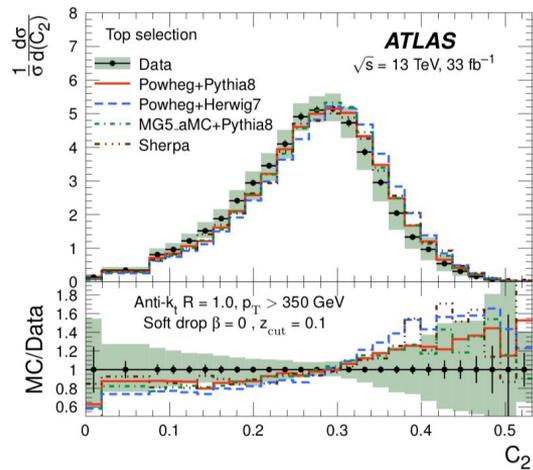
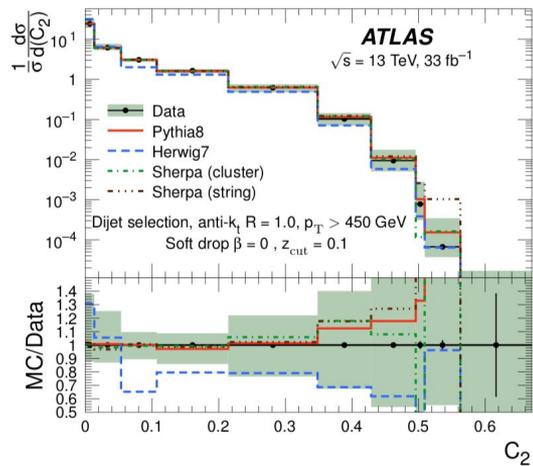


- Cluster and large R systematics dominate in all topologies
  - Largest effect on the majority of measured distributions from cluster energy smearing (CES)

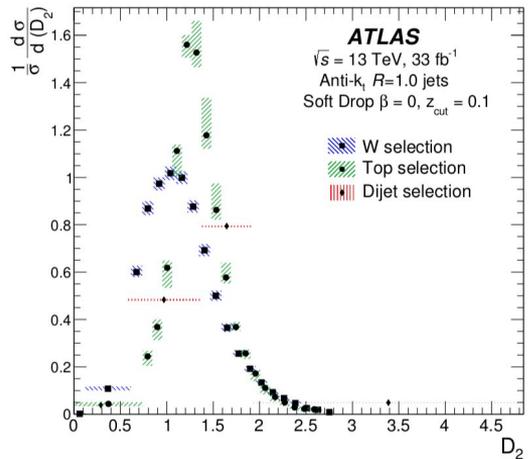
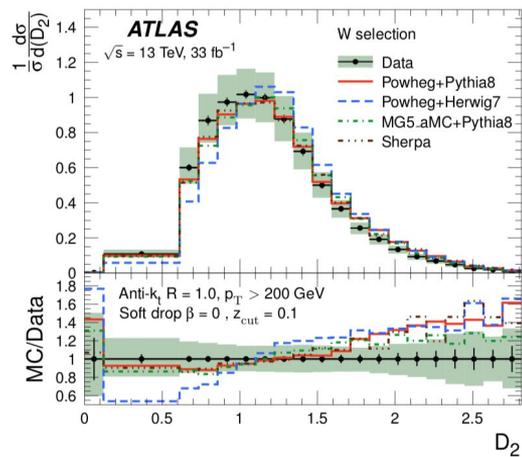
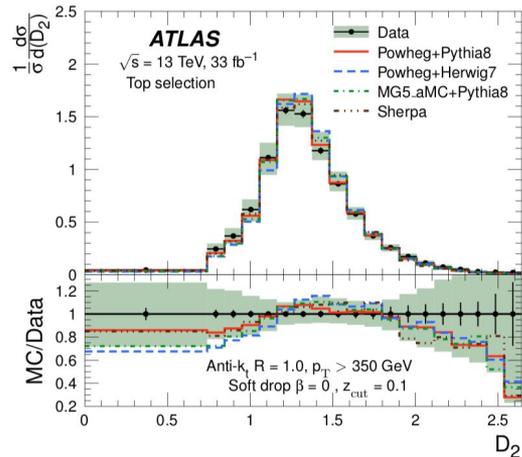
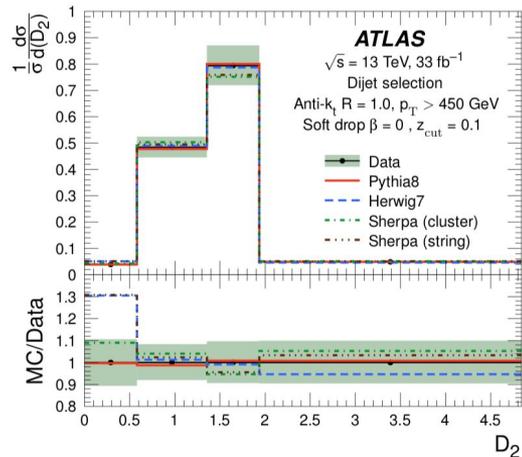
# Results



# Results



# Results



# Multijet simulation for 13 TeV ATLAS Analyses

ATL-PHYS-PUB-2019-017

# Overview

- Jet shape: normalized  $p_T$  flow inside the jet cone as a function of the angular distance to the jet axis
- Two versions:
  - the differential jet shape is defined as the fraction of  $p_T$  in a circular crown of width  $\Delta r$  at a distance  $r < R$  of the jet centroid

$$\rho(r) = \frac{1}{\Delta r} \frac{p_T(r - \Delta r/2, r + \Delta r/2)}{p_T(0, R)}$$

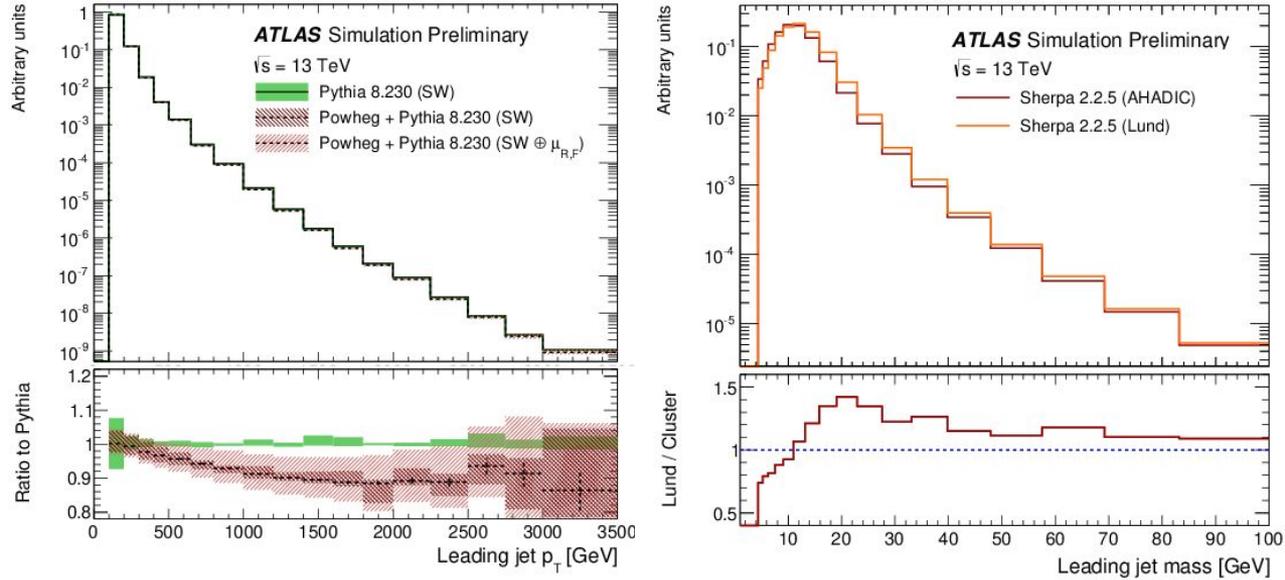
- the integrated jet shape is defined as the cumulative distribution  $\Psi(r)$ . Geometrically, it can be regarded as the fraction of momentum in circles of radius  $r < R$  taken from the jet axis

$$\Psi(r) = \frac{p_T(0, r)}{p_T(0, R)}$$

- Both are  $\overline{O\bar{E}}$  sensitive to the kinematics of the jet under study.
  - the radiation around the original parton becomes more collimated when increasing the jet  $p_T$ , giving higher values of  $\rho(r)$  for small values of  $r$  and also higher values of  $\Psi(r)$  overall

-

# Results



- Pythia 8 shower uncertainty largest at low  $p_T$ , but negligible at mid/high  $p_T$
- Powheg + Pythia 8
  - reduced impact of the combined ME+PS uncertainties at low  $p_T$  (one extra parton included at ME at LO)
  - uncertainty slightly increases as a function of the jet  $p_T$  (due to the increase in PDF uncertainty)
- Sherpa two different hadronization models show differences of up to 45%
  - low  $p_T$  jets described by the cluster model are more collimated than their string model counterparts
    - as the mass distribution peaks at lower values