

Study of Large Radius Jet  
Mass Reconstruction for  
Higgs Pairs

**Talia Saarinen,**  
Supervisor: Maximilian Swiatlowski

- The ATLAS Experiment
- Why Study HH?
  - Why Boosted ggF  $HH \rightarrow 4b$ ?
- Reconstruction Strategies and Missing Muons
- Quantifying Mass Sensitivity

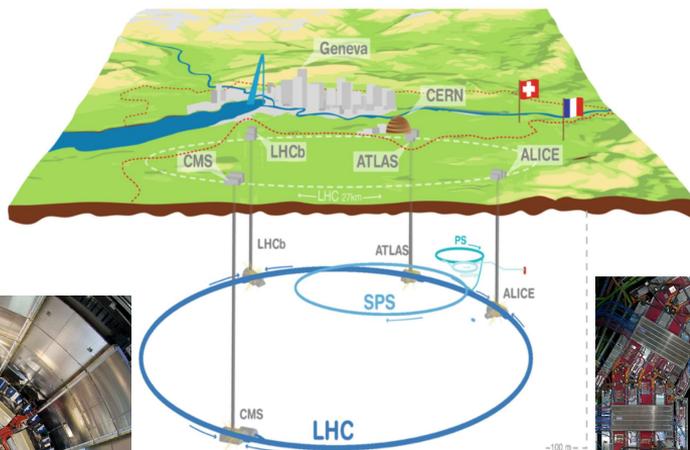
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# The LHC

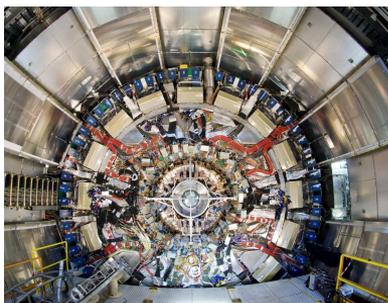
- 27 km-circumference circular synchrotron collider on Franco-Swiss border. Primarily proton-proton collisions
- Two beams of protons are brought together to collide in 4 points along the ring: ATLAS, ALICE, CMS, and LHCb



LHCb



ALICE



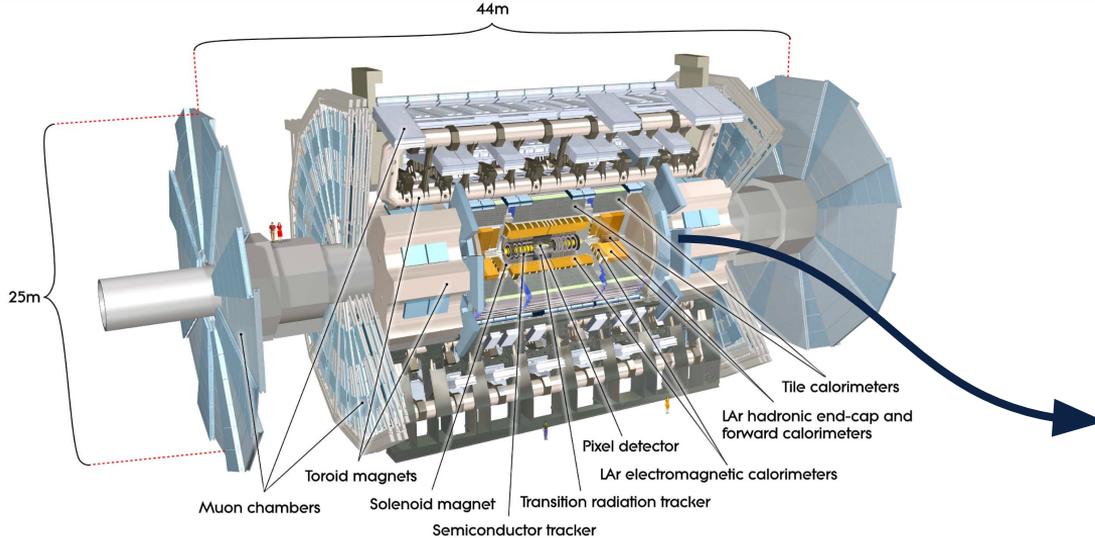
ATLAS



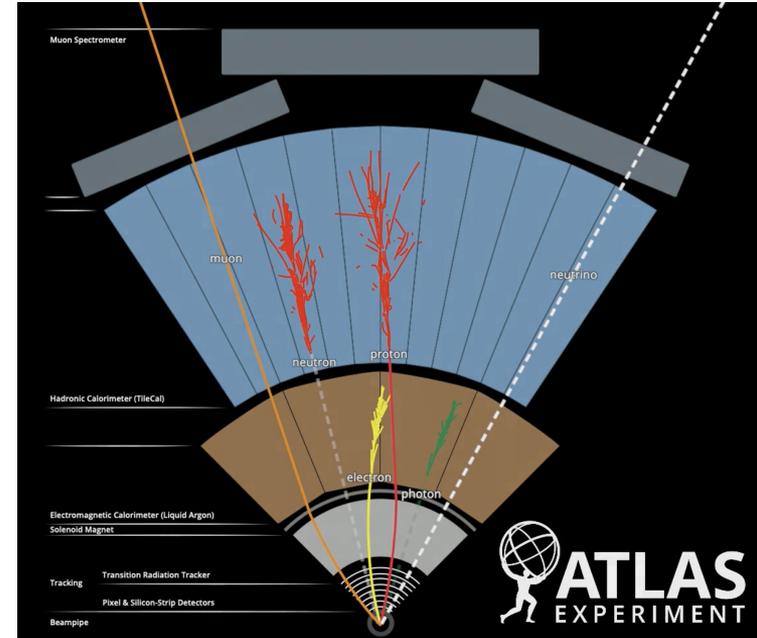
CMS

Source: [atlas.cern](https://atlas.cern), [home.cern](https://home.cern), [cms.cern](https://cms.cern), [home.cern](https://home.cern)

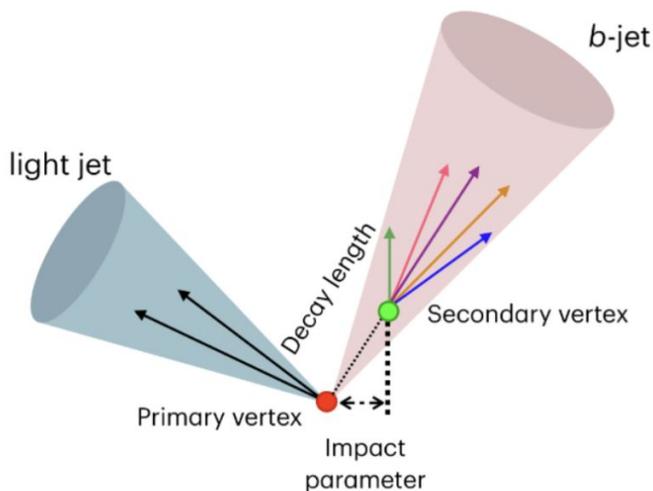
# The ATLAS Experiment



- General-purpose experiment
- 44m x 25 m toroid surrounding a collision point
- Components (innermost to outermost):
  - Inner tracker → EM Calorimeter → Hadronic Calorimeter → Muon Spectrometer



Source: [ATLAS Twiki](#), [CERN](#)



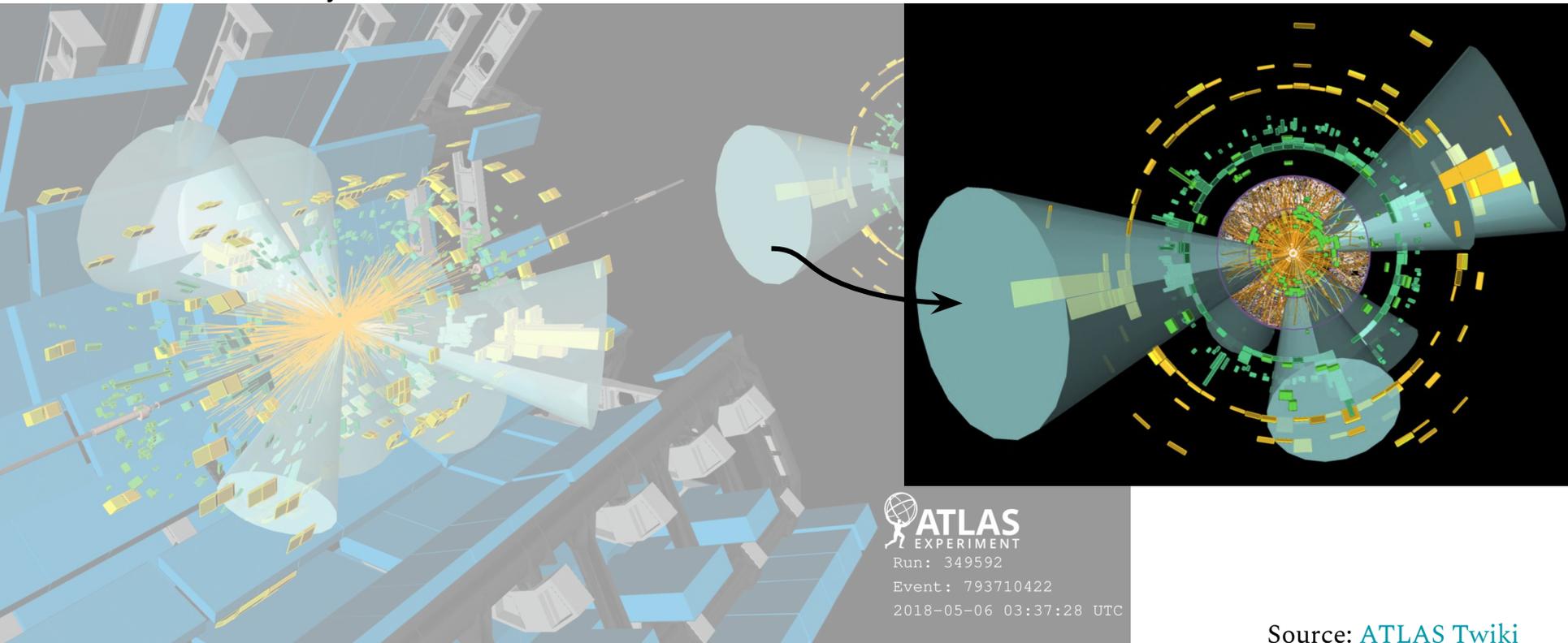
- **Tracks** are paths individual charged particles take away from the collision point. Tracks make **hits** on the detector layers as they leave
- **Jets** are collections of particles that come from an original particle – like a b-quark
- **B-jets** start with a b-quark, forms B-hadrons → characterized by long lifetimes + secondary vertices
- Not this idealized in the actual detector – lots of pileup, overlapping tracks scramble reconstruction efforts...

Source: [ATLAS Twiki](#)

# The ATLAS Experiment: Tracks and Jets



What this actually looks like: (actual HH4b candidate event)



Source: [ATLAS Twiki](#)

# The ATLAS Experiment: Tracks and Jets



What this actually looks like:

Actual conditions make studying events with low cross sections like HH difficult. High-lumi upgrade will increase collisions per bunch crossing, making HH even harder to find.

In order to study these events, improving sensitivity is a priority, especially jet kinematics  $\rightarrow$  Jet  $P_T$ , **mass**, etc.

But **why study HH events** in the first place? And why the **boosted HH $\rightarrow$ 4b?**



Event: 793710422  
2018-05-06 03:37:28 UTC

Source: [ATLAS Twiki](#)

- The ATLAS Experiment
- **Why Study HH?**
  - Why Boosted ggF  $HH \rightarrow 4b$ ?
- Reconstruction Strategies and Missing Muons
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# Why $HH \rightarrow 4b$ ?



## SM Lagrangian

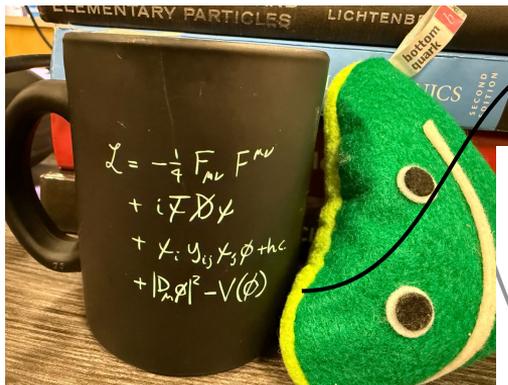
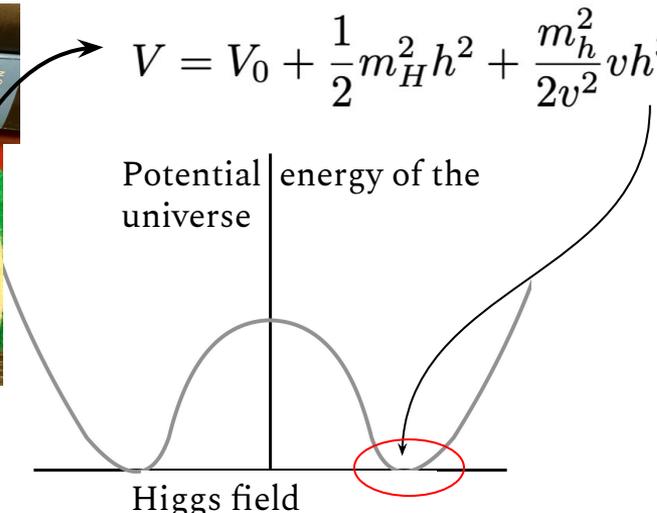
## Expand Higgs Potential About Minimum

$$V = V_0 + \frac{1}{2}m_H^2 h^2 + \frac{m_h^2}{2v^2} v h^3 + \dots$$

Potential energy of the

Coefficients of cubic (and higher) terms describe the **Higgs Potential**

Higgs field



Source: [G. Aad-PhysRevD.108.052003](https://arxiv.org/abs/1005.4573)

# Why $HH \rightarrow 4b$ ?



SM Lagrangian

Expand Higgs Potential About Minimum

$$V = V_0 + \frac{1}{2}m_H^2 h^2 + \frac{m_h^2}{2v^2} v h^3 + \dots$$

Potential energy of the universe

Higgs field

Coefficients of cubic (and higher) terms describe the **Higgs Potential**

Understanding the **Higgs Potential** tells us how particles gain mass  $\rightarrow$  key to answer big-ticket questions

Source: [G. Aad-PhysRevD.108.052003](https://arxiv.org/abs/1005.4572)

# Why $HH \rightarrow 4b$ ?

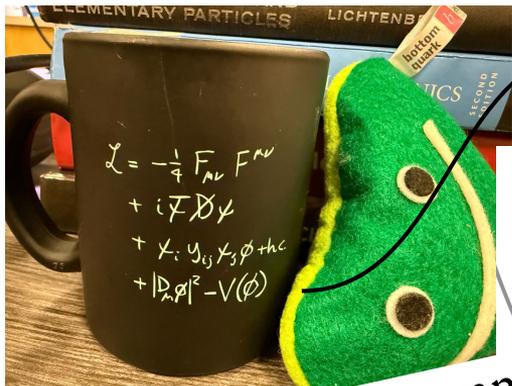


SM Lagrangian

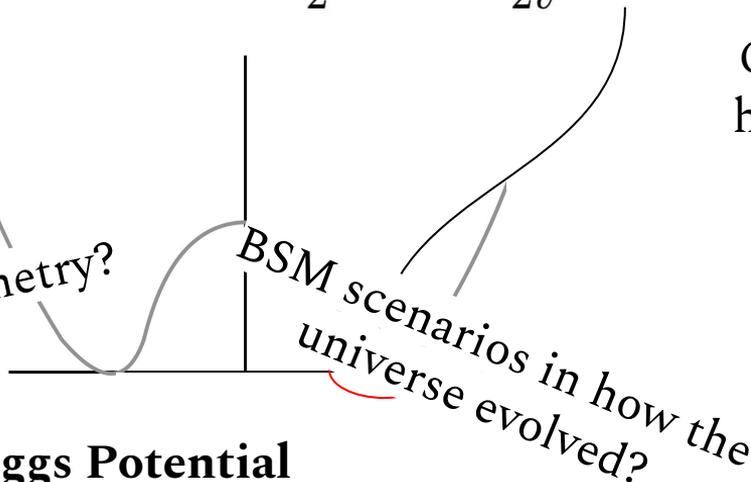
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Coefficients of cubic (and higher) terms describe the **Higgs Potential**



Matter-antimatter asymmetry?



Understanding the **Higgs Potential** tells us how particles gain mass  $\rightarrow$  key to answer big-ticket questions

BSM scenarios in how the universe evolved?  
Will our laws of physics change in the future?

Source: [G. Aad-PhysRevD.108.052003](https://arxiv.org/abs/1005.2003)

# Why $HH \rightarrow 4b$ ?

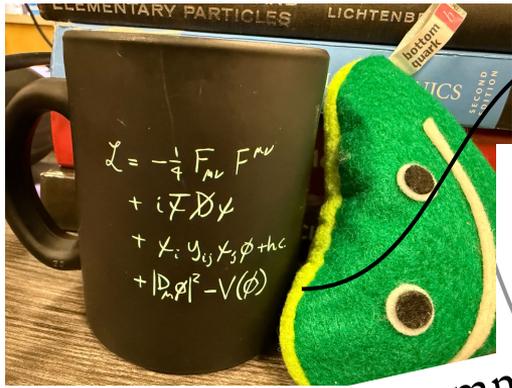


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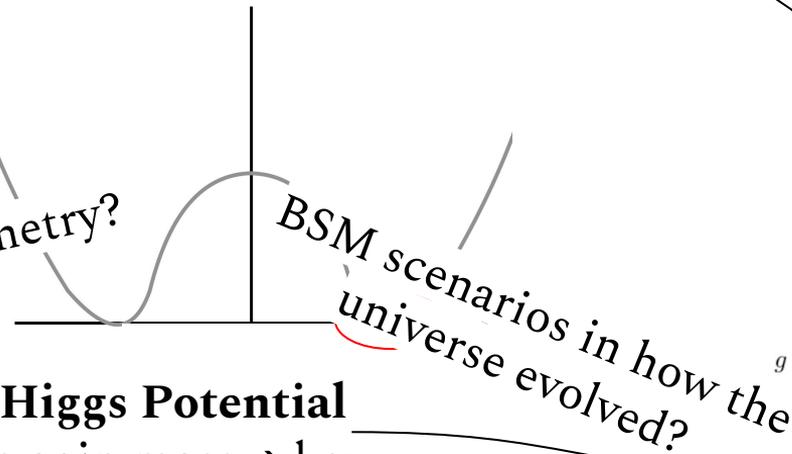
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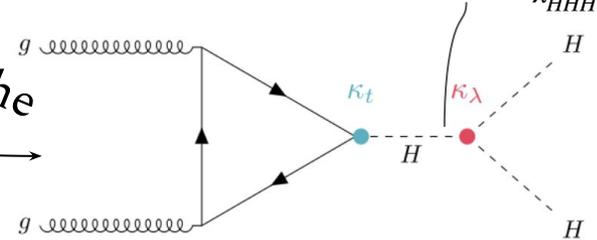
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Understanding the **Higgs Potential** tells us how particles gain mass  $\rightarrow$  key to answer big-ticket questions

Will our laws of physics change?

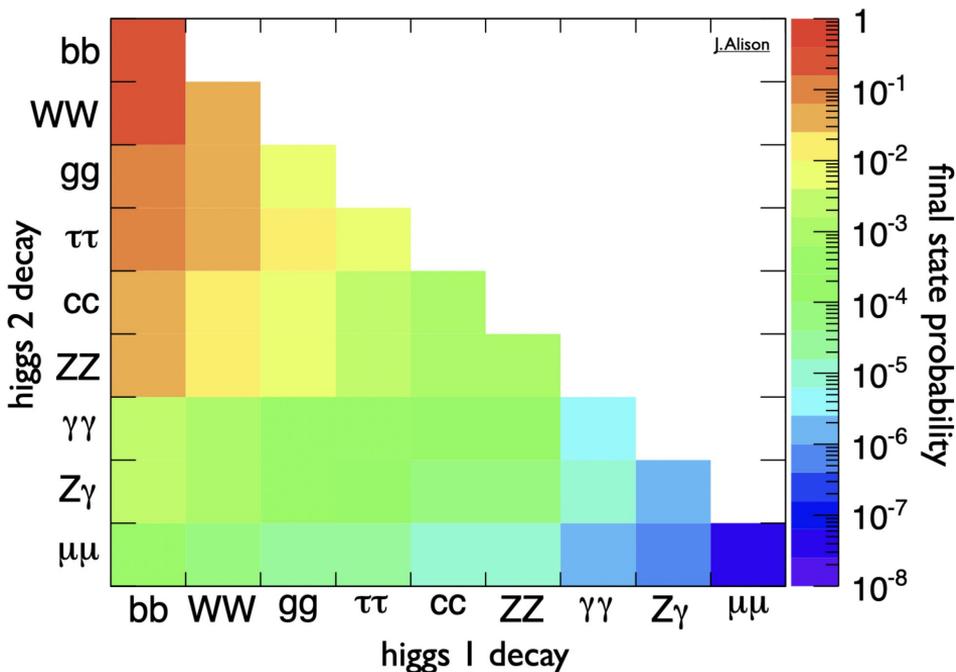
This is the goal:  $\kappa_\lambda = \frac{\lambda_{HHH}}{\lambda_{HHH}^{SM}}$



Source: [G. Aad-PhysRevD.108.052003](https://arxiv.org/abs/1005.2003)

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# Why $HH \rightarrow 4b$ ?



## Why 4b?

- $H \rightarrow 2b$  is the highest cross section decay channel for higgs with 58.2% branching ratio  $\rightarrow HH4b$  most populated channel for HH

## But

- Noisy channel as many other processes have bb end states:
  - QCD Jets
    - Top quark pair production
    - Jets from strong interaction
  - Light-quark-initiated jets misidentified as originating from heavy quarks

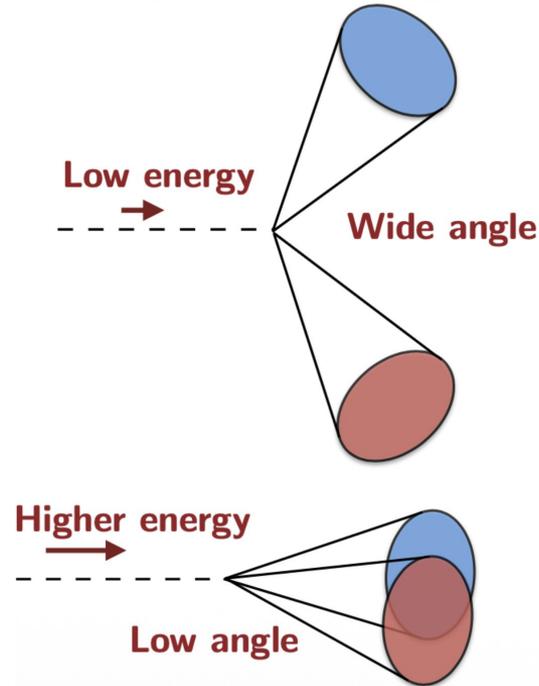
Source: [G. Aad-PhysRevD.108.052003](https://arxiv.org/abs/1005.2003), John Alison (CMS)

# Why Boosted $HH \rightarrow 4b$ ?



## Sidestep sensitivity limitations by considering boosted regime

- At higher  $P_T$  ranges, jets are more attenuated
- Resolution becomes difficult, so grouping into two large R jets yields better results

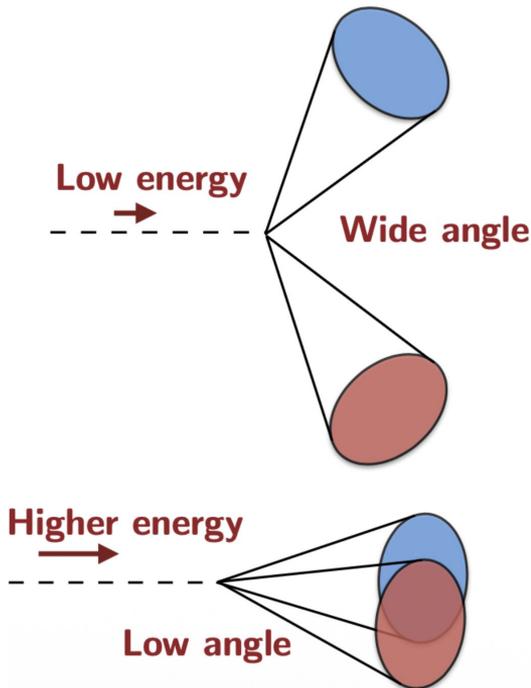


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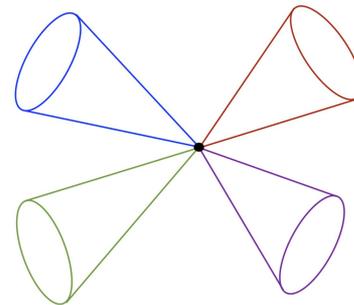
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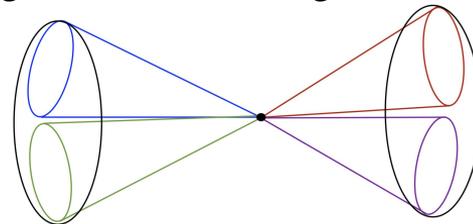
- At higher  $P_T$  ranges, jets are more attenuated
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Previously:  
Separately resolve 4 bottom jets

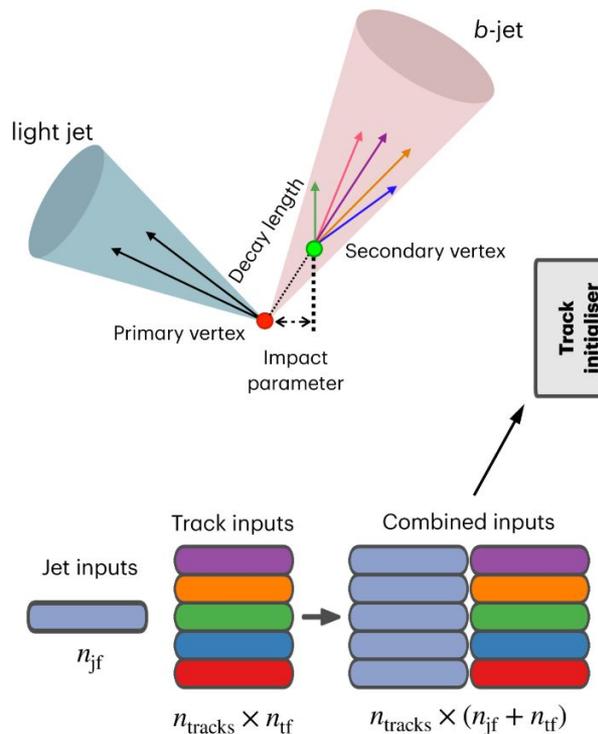


Boosted Regime:  
Tag 2 boosted large radius jets

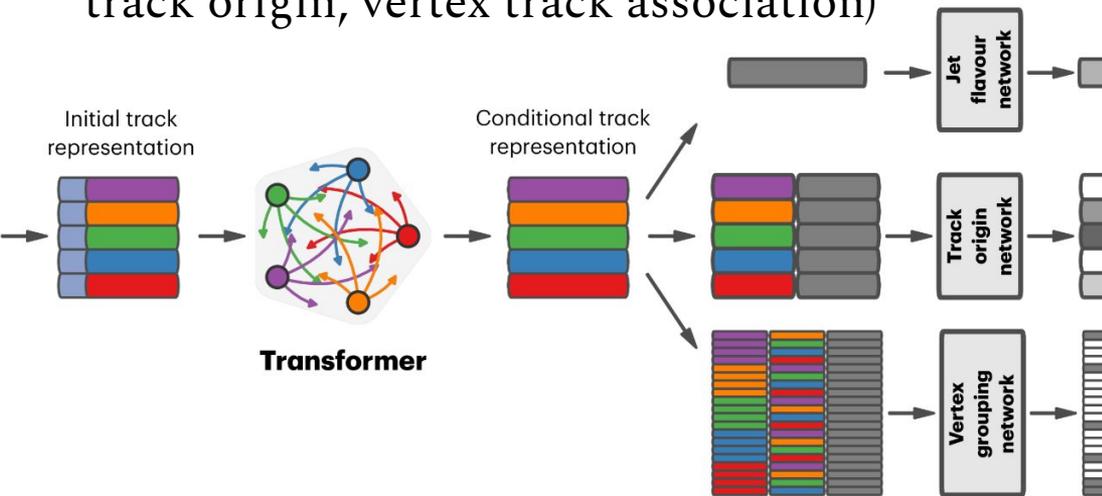


Source: [G. Aad-PhysRevD.108.052003](https://arxiv.org/abs/1805.052003)

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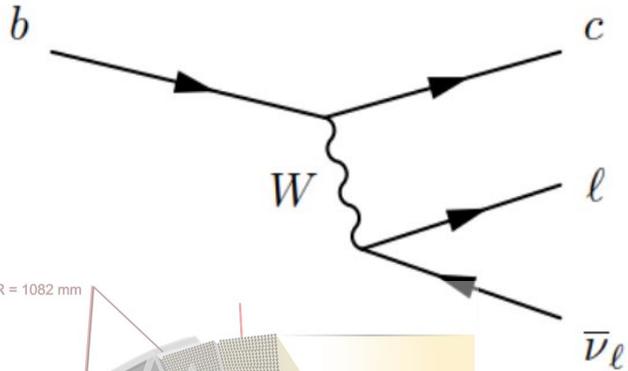
- **GN2X:** Trained for  $H \rightarrow bb$  and  $H \rightarrow cc$  identification (and track origin, vertex track association)



- Training data: 62 million jets,  $H \rightarrow cc$ ,  $H \rightarrow bb$  (signal) and top and multijet (background). Inputs include jet constituents  $\rightarrow$  improvement to Xbb

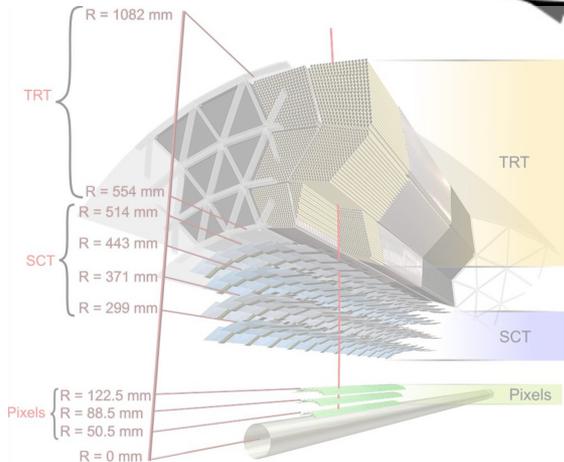
Source: [FTAG-2023-05](#)

GN2X is a good improvement from Xbb, but...



## Missing Muons in Jet Reconstruction

- Muons are radiated via semileptonic decays within  $b$  jets  $\sim 10\%$
- Muons are “lost”  $\rightarrow$  not associated with the jet they originated in, happens mainly in data readout
- Jet energy consistently underestimated as energy associated with muons are not included in reconstruction calculations

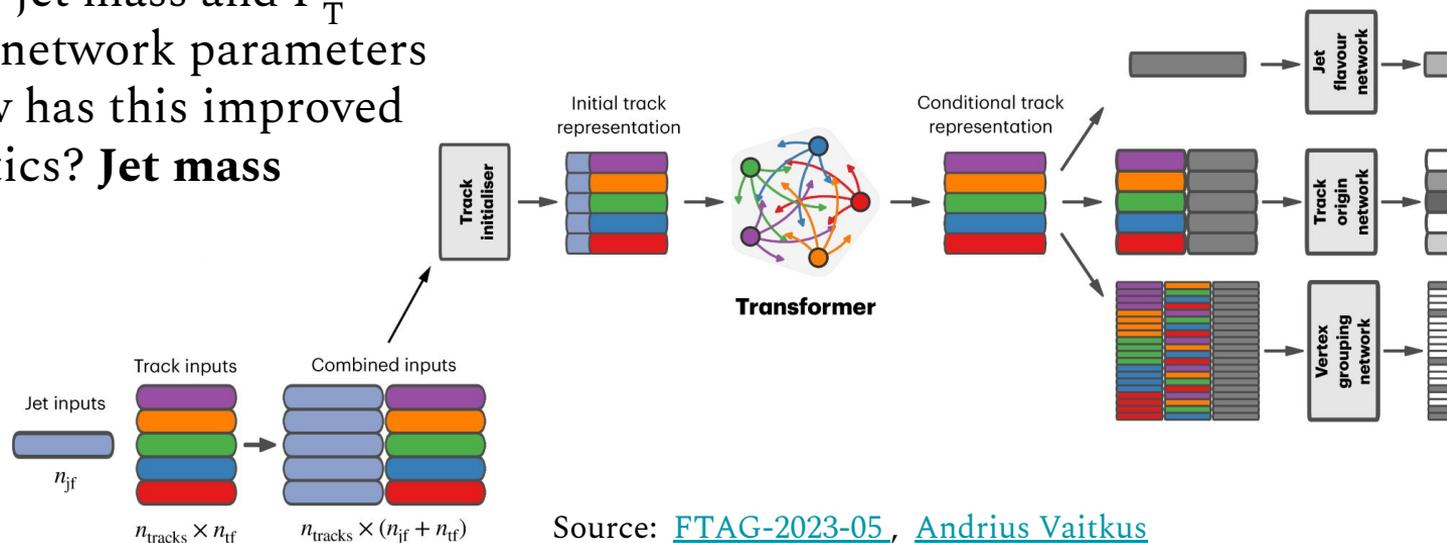


Source: [Marco Battaglia](#), [Evrpidis Koutsoumpas](#), [Andrea Sciandra](#), [CERN HFLAV](#)



## ML Regressions for Jet Mass and $P_T$

- Fixes MIJ problem + others
- Trained on some of the data used for GN2X
  - H→bb, H→cc, QCD (but no top) – 180 million jets, Trained for jet mass and  $P_T$
  - 5.6 million network parameters
- My project: how has this improved jet kinematics? **Jet mass**



Source: [FTAG-2023-05](#), [Andrius Vaitkus](#)

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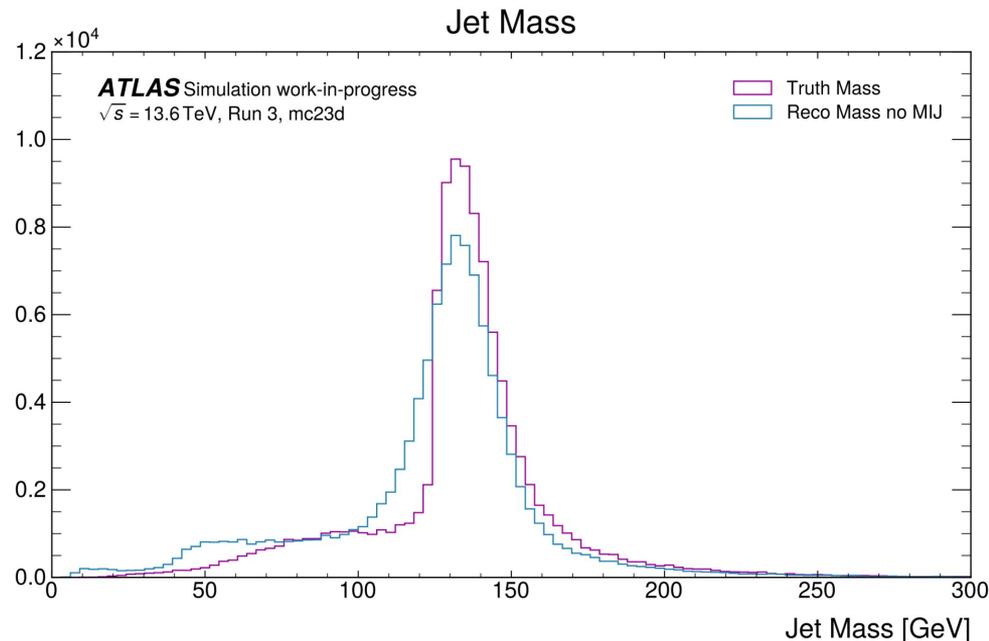
# Comparing Mass Sensitivity



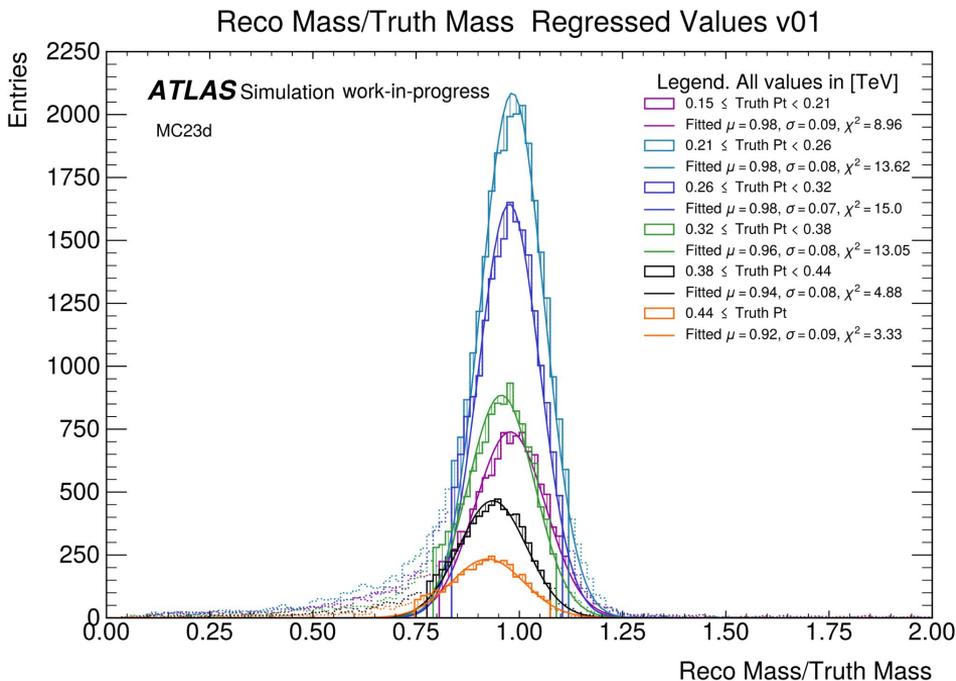
## Strategy:

- Used simulated Run 3 signal  $HH \rightarrow 4b$  samples [50,000 jets] to compare:
  - Baseline reconstruction
  - Muon-in-jet correction added
  - Regressed values V01: Trained on data **with** muons in jets

Take a ratio of these two  
(between matched jets)



# Comparing Mass Sensitivity



## Procedure:

- Require at least two reconstructed jets in each event
- Required true combined HH mass of 0.5 TeV
- Ensured that truth reconstructed jets had minimal distance in  $\phi - \eta$  space (truth-reco consistency) by minimizing  $\Delta R = \sqrt{\phi^2 + \eta^2}$  (built-in for Newer Data)
- Plotted  $\frac{Mass_{reco}}{Mass_{true}}$  partitioned by true  $P_T$

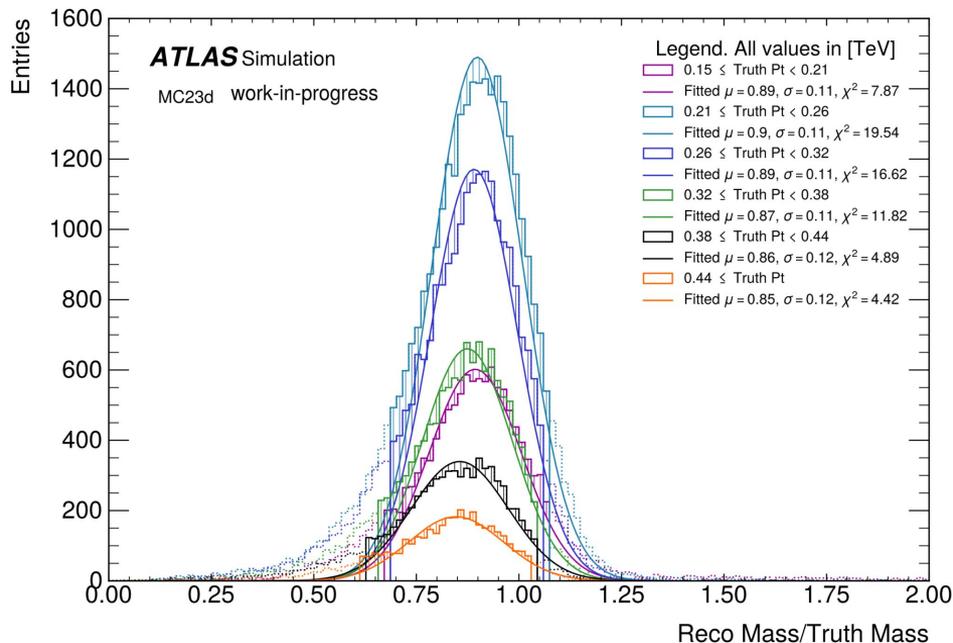
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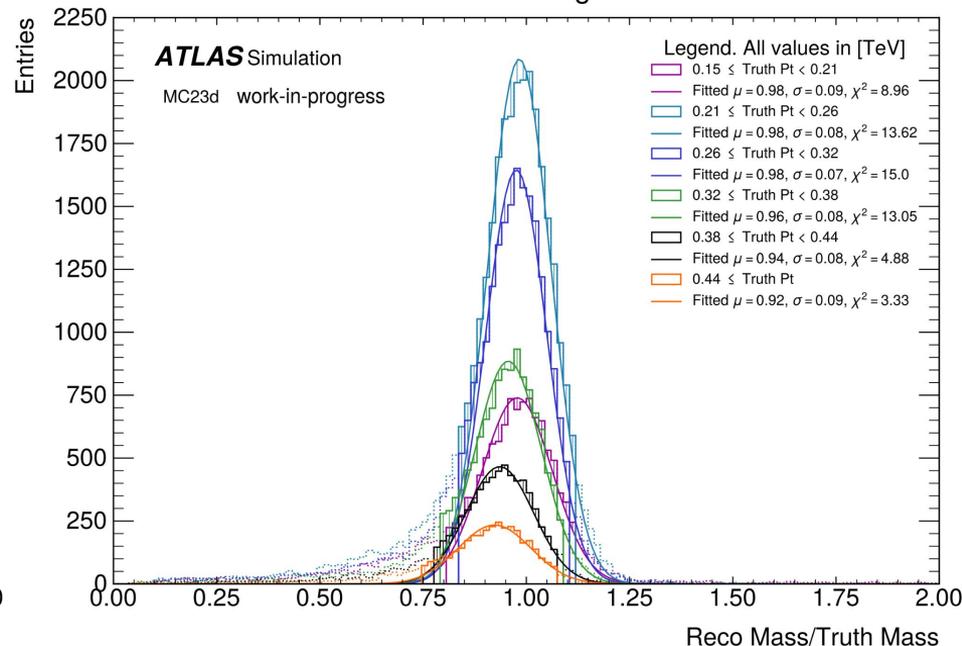
- Tails are long and asymmetrical, so truncate the central curve and fit a gaussian. Discard bins with counts smaller than

$$RMS = \left[ \frac{1}{N_{bins}} \sum (counts)^2 \right]^{1/2} \quad (\text{sensitive to binning})$$

Reco Mass/Truth Mass MIJ Correction



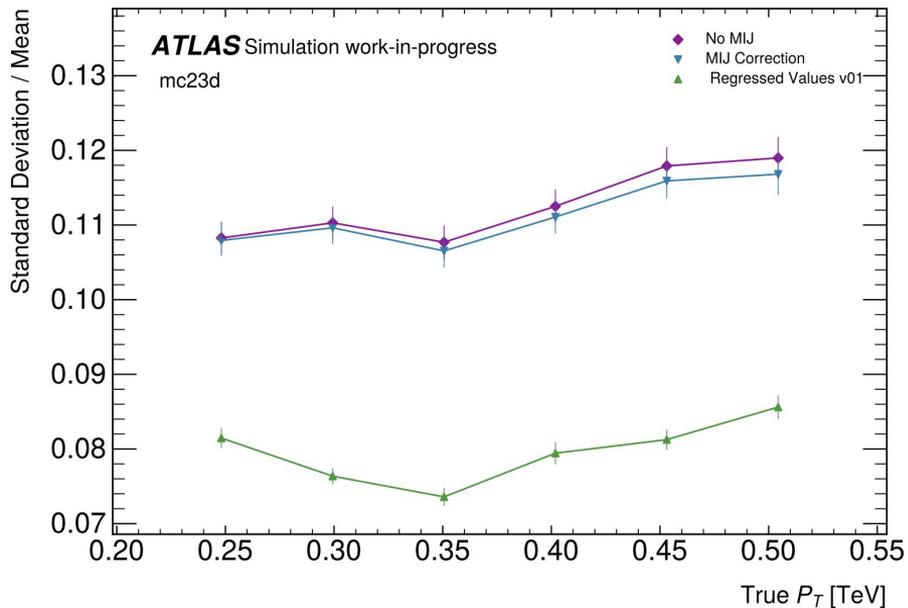
Reco Mass/Truth Mass Regressed Values v01



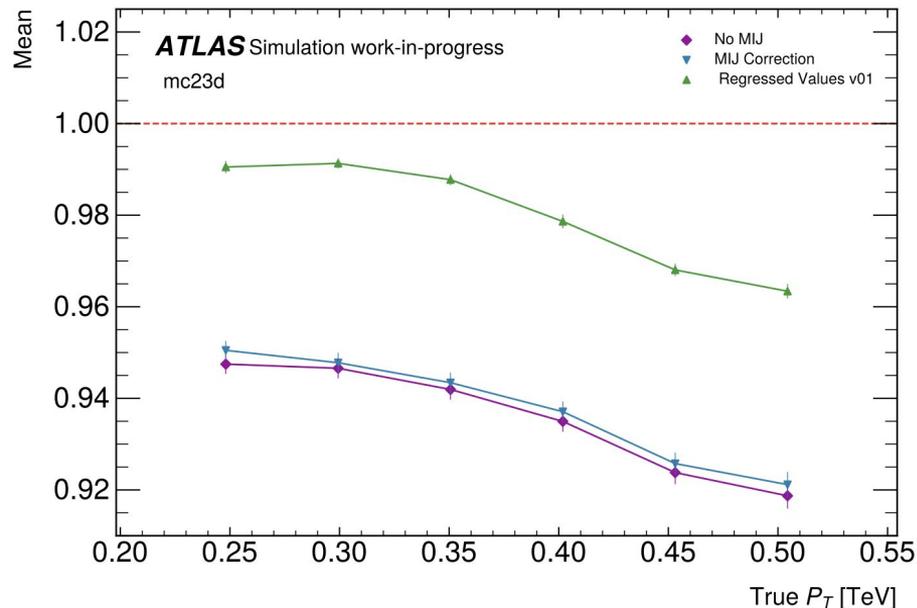
# Comparing Mass Sensitivity



Std of Gaussian Fit for Reco Mass/Truth Mass vs True  $P_T$  [TeV]



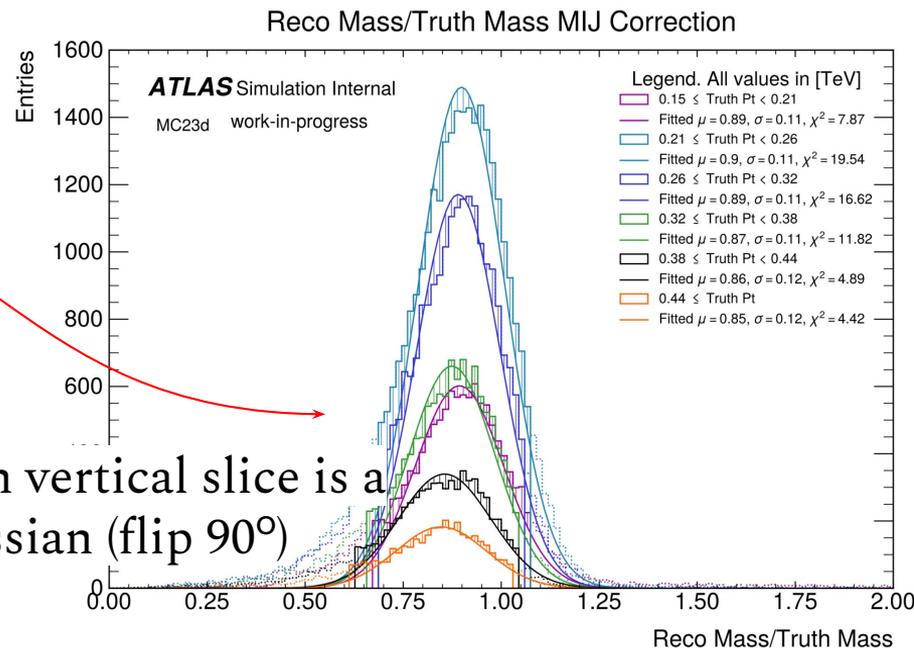
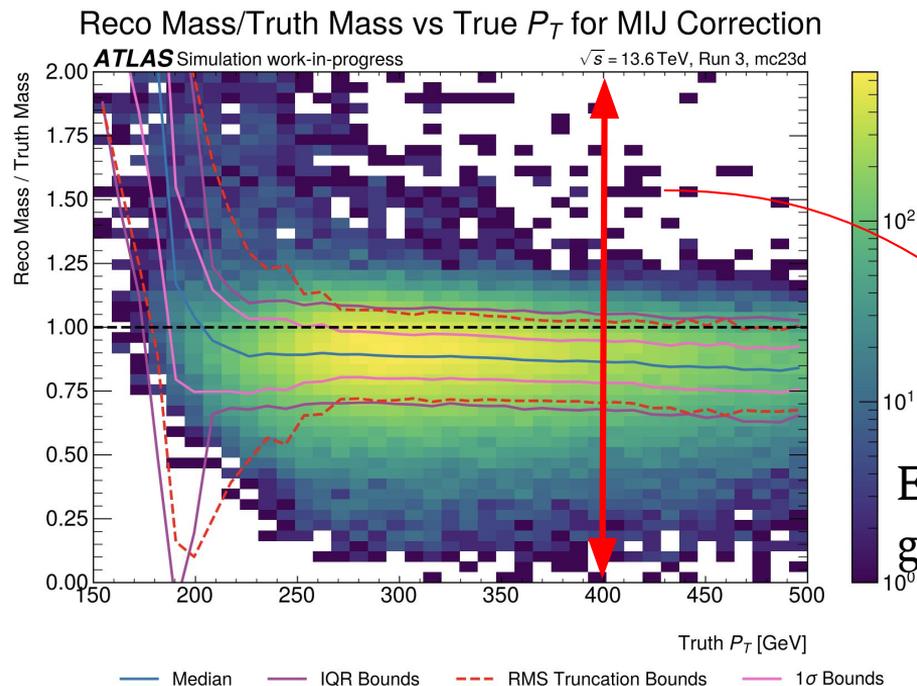
Mean of Gaussian Fit for Reco Mass/Truth Mass vs True  $P_T$  Bin [TeV]



# Comparing Mass Sensitivity



- Using finer  $P_T$  binning, median and interquartile range (IQR) to capture contribution on tails

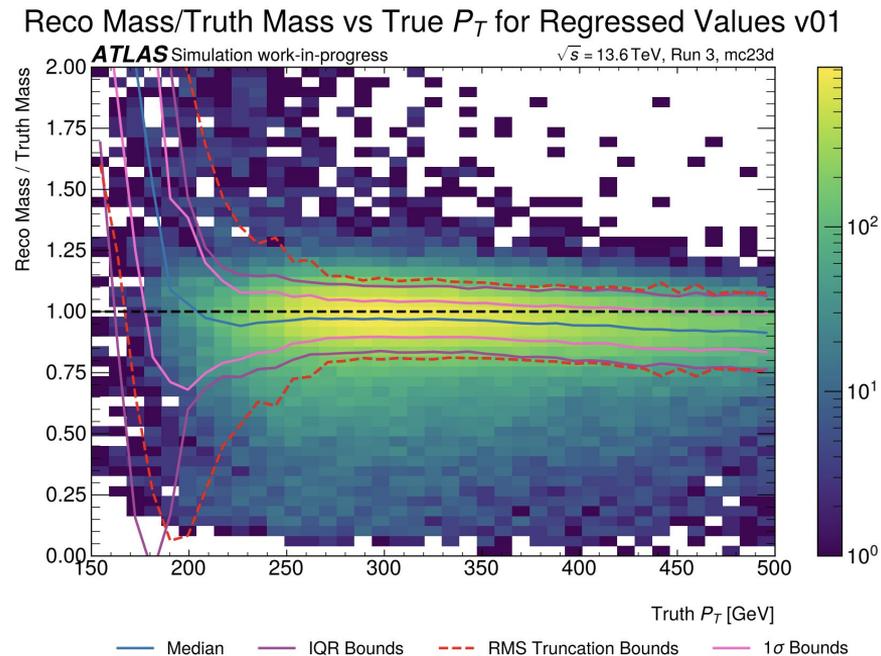
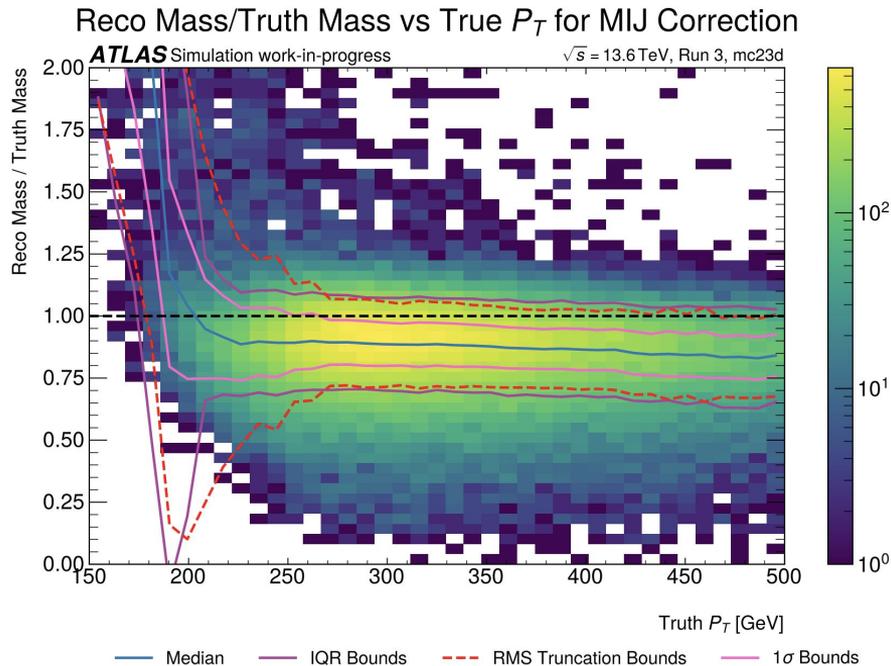


Each vertical slice is a gaussian (flip  $90^\circ$ )

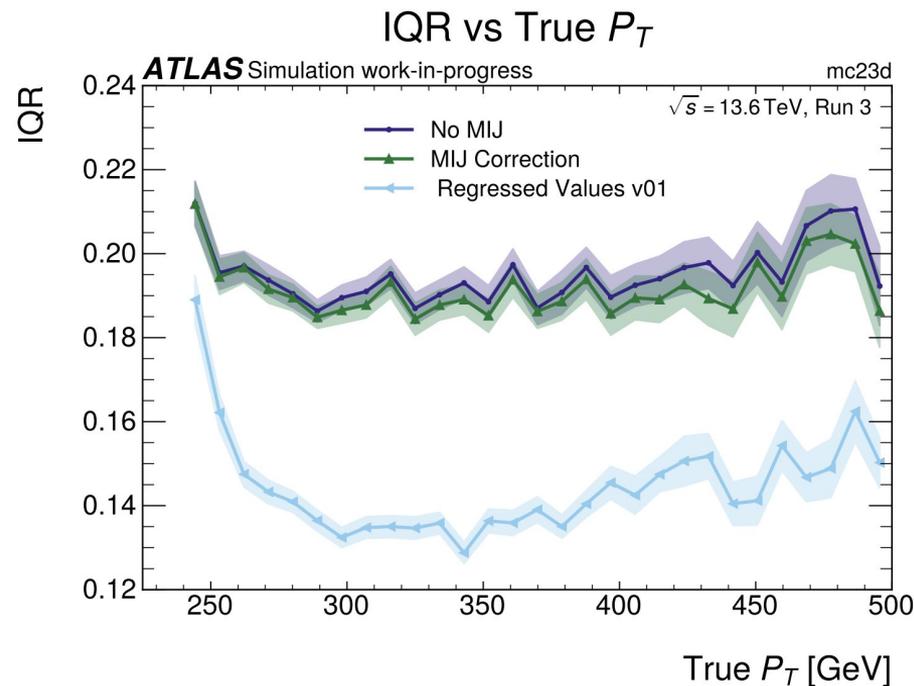
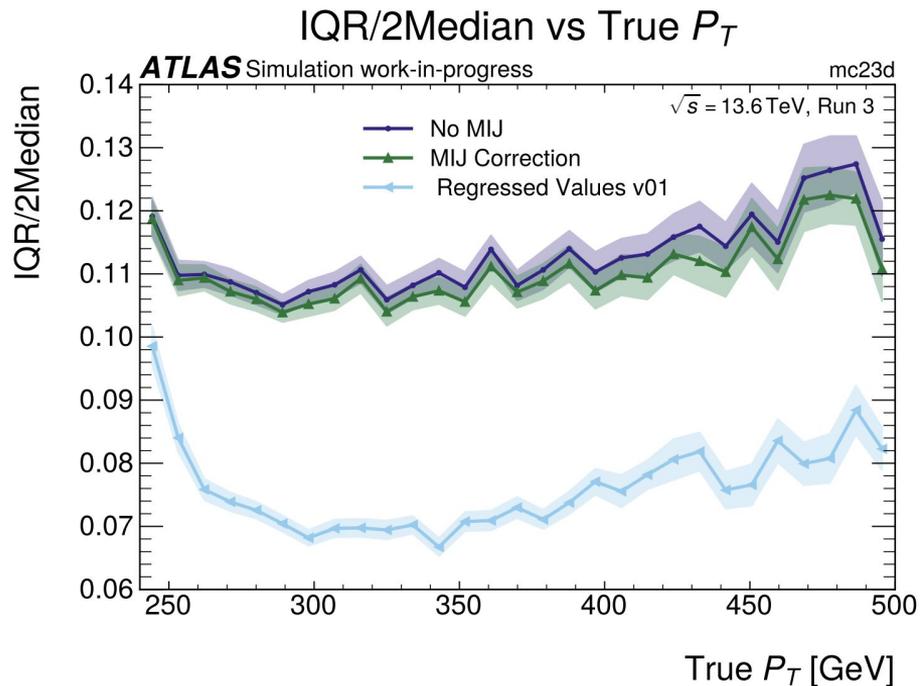
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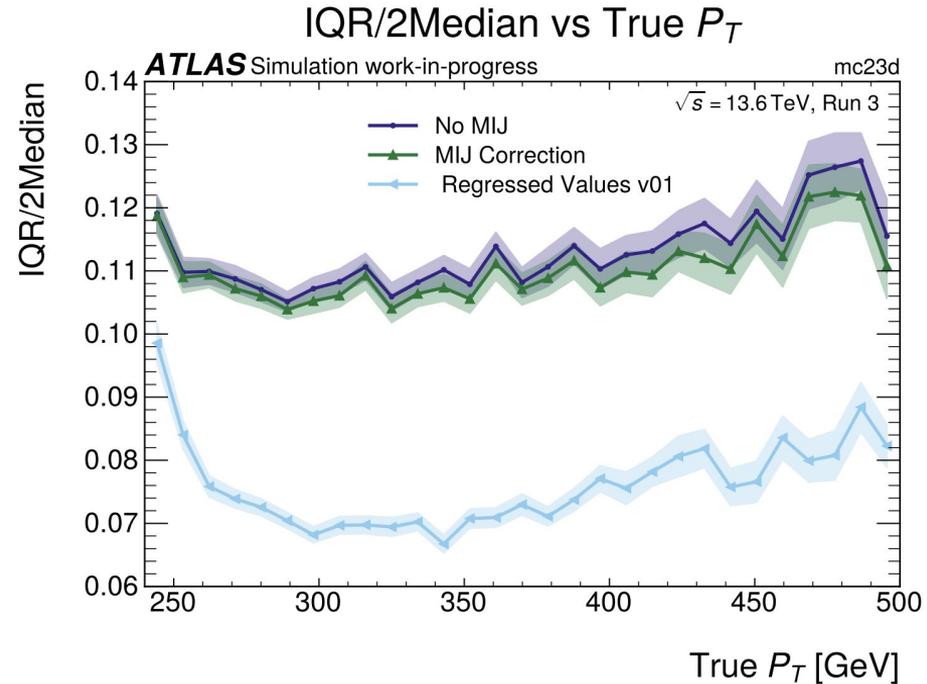
# Comparing Mass Sensitivity



# Conclusion



- We study HH4b to characterize the Higgs potential by measuring coupling constants:  $\kappa_\lambda = \frac{\lambda_{HHH}}{\lambda_{HHH}^{SM}} \rightarrow$  answers to even larger questions, BSM scenarios, etc.
- Accurate reconstruction of jet kinematics, including jet mass, is needed to increase sensitivity to detect events with small cross sections  $\rightarrow$  HH4b
- Demonstrated improvement to mass sensitivity by adding missing MIJ energy to jets. Using ML regression for jet mass works even better



## Figures

- ATLAS, ALICE, CMS, LHCb images: [atlas.cern](https://atlas.cern), [home.cern](https://home.cern), [cms.cern](https://cms.cern), [home.cern](https://home.cern)
- General Diagrams: [ATLAS Twiki](#), [CERN](#)
- Event Displays: [ATLAS Twiki](#)
- ATLAS Coordinate System: [ATLAS-OUTREACH-2025-016](#)
- GN2X Schematic: [FTAG-2023-05](#)

## Papers and Presentations:

- Muon-In-Jet Correction for the Inclusive/ggH boosted Hbb Analysis - [Marco Battaglia, Evripidis Koutsoumpas, Andrea Sciandra](#)
- Performance of Large- R Jet Regression: bJ10v00Ext, bJR10v01 - [Andrius Vaitkus](#)
- Search for nonresonant pair production of Higgs bosons in the bbbb final state in pp collisions at  $\sqrt{s}=13$  TeV with the ATLAS detector - [G. Aad-PhysRevD.108.052003](#)
- How Pairs of Higgs Bosons Help Us Understand the Standard Model and Beyond - [M.Swiatlowski, 2024](#)



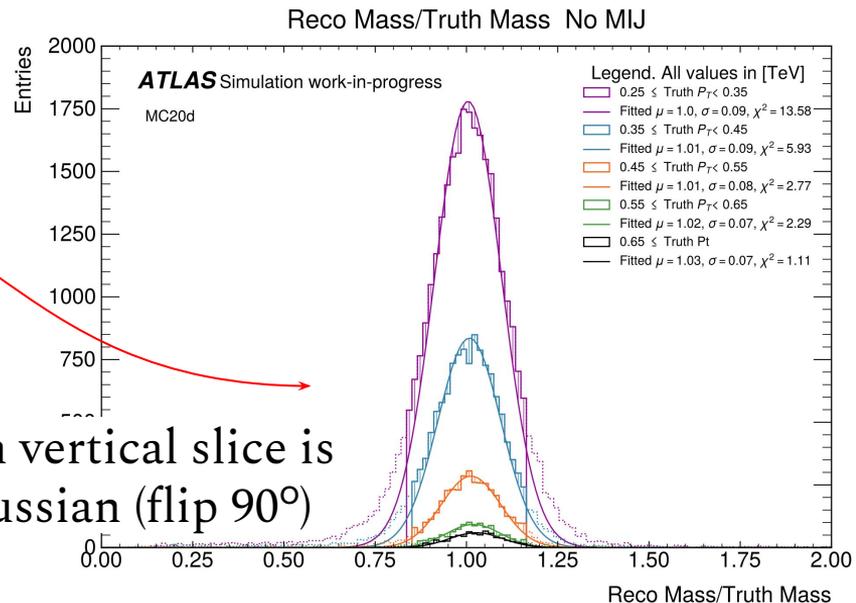
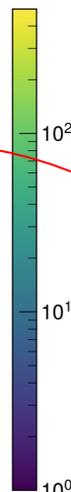
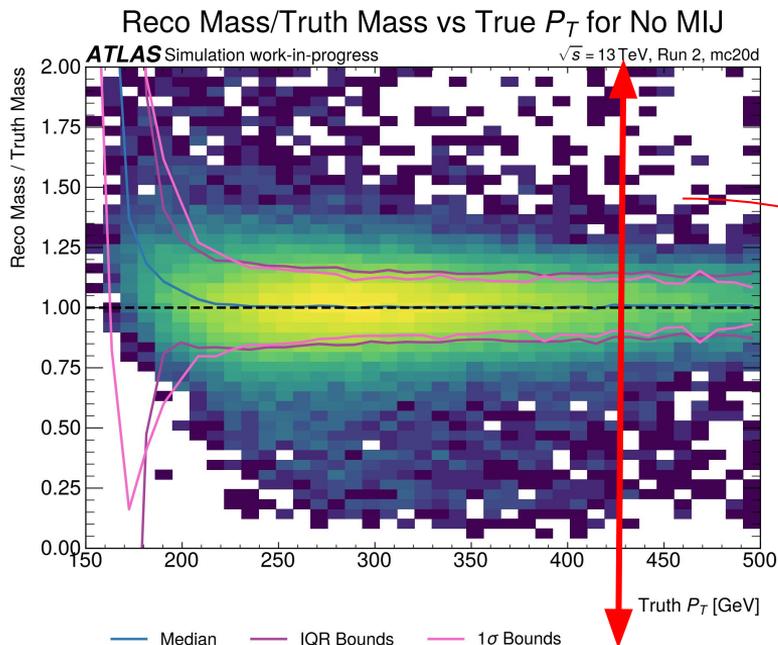
# Backup

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# Comparing Mass Sensitivity



- Using finer PT binning, median and IQR to capture contribution on tails
- Truth in the denominator here does **not** include muons



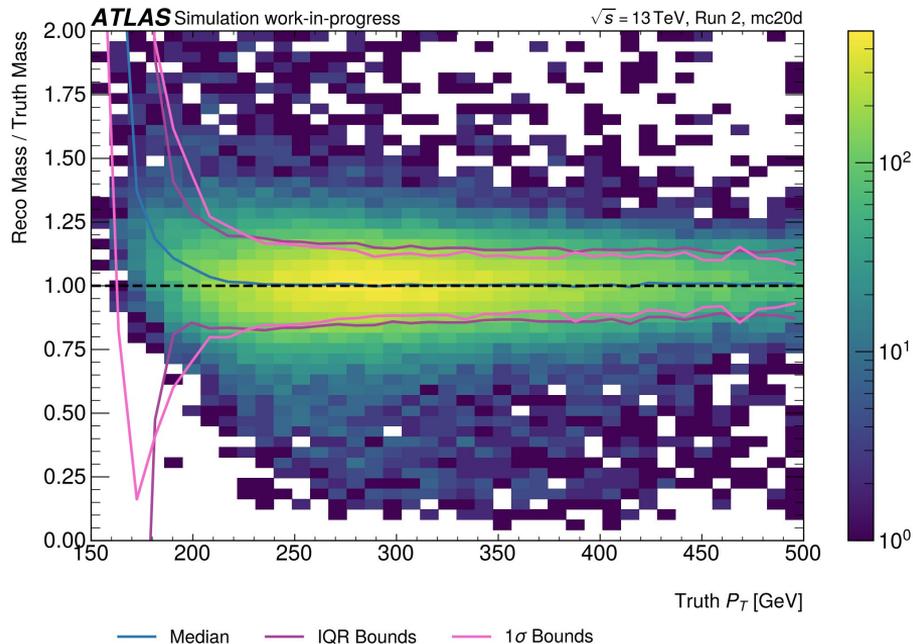
Each vertical slice is a gaussian (flip 90°)

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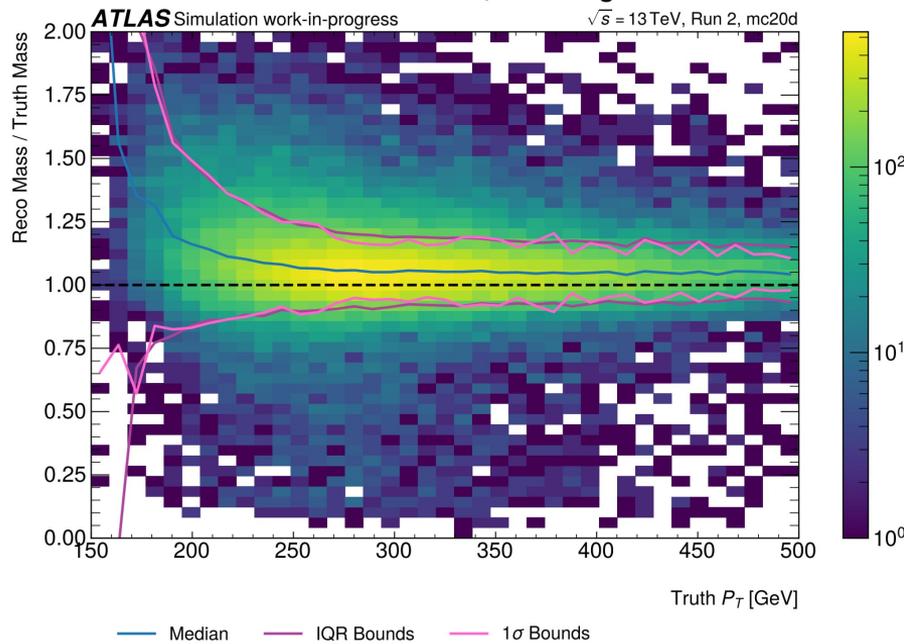


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Reco Mass/Truth Mass vs True  $P_T$  for No MIJ



Reco Mass/Truth Mass vs True  $P_T$  for Regressed Values v01

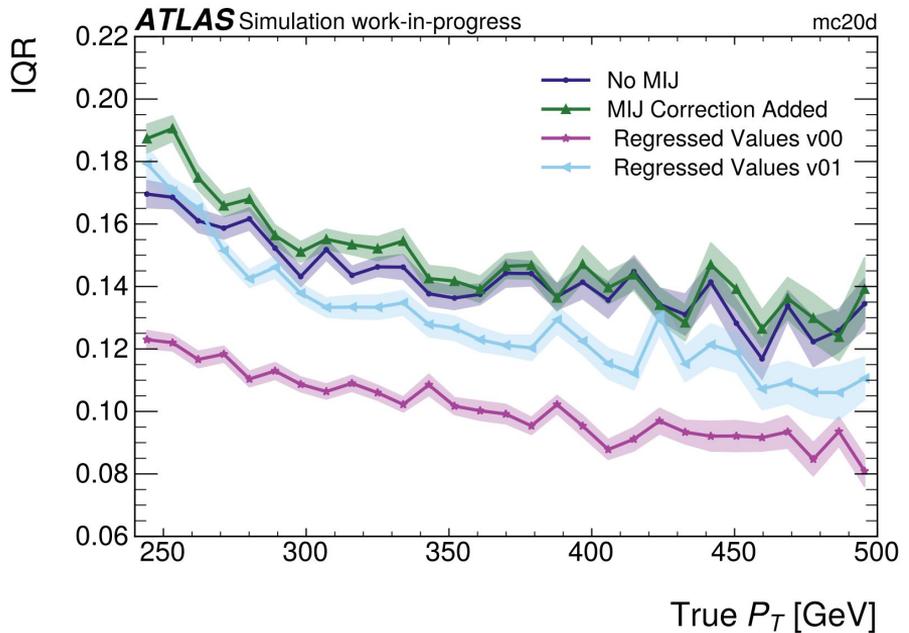


# Comparing Mass Sensitivity (Older Data)

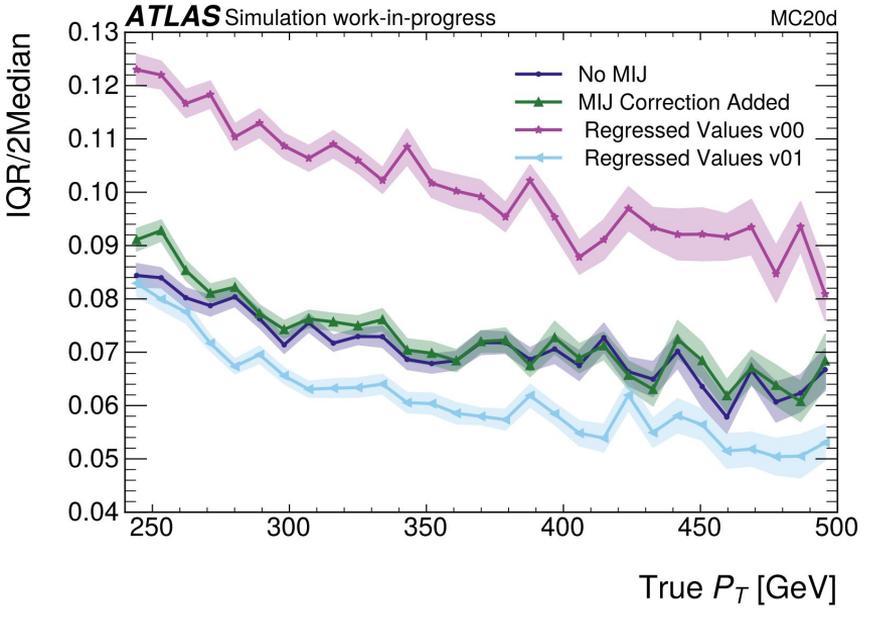


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### IQR vs True Pt

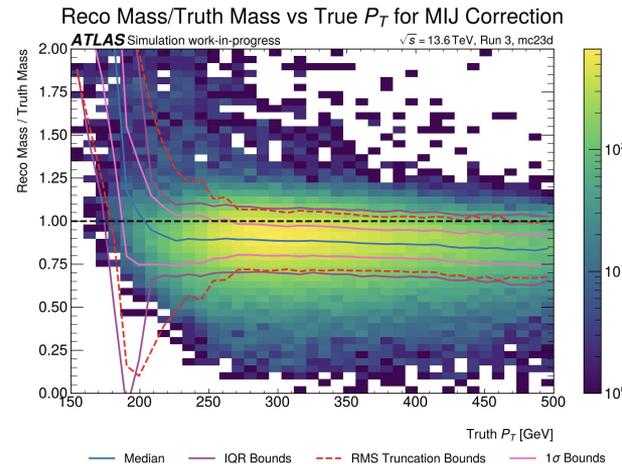
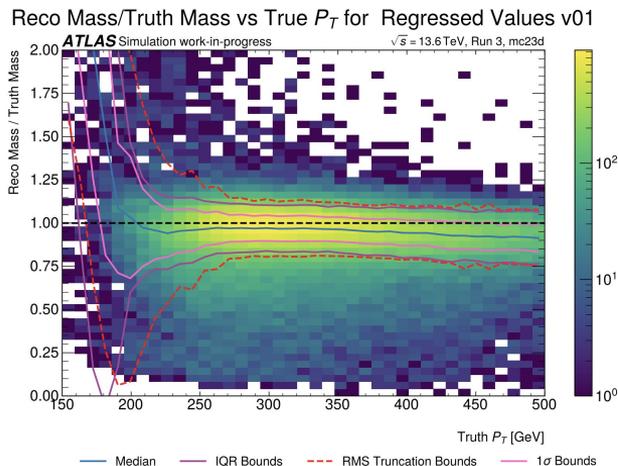
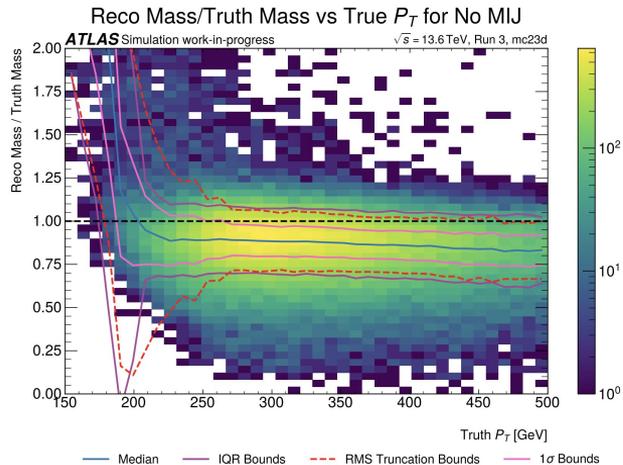


### IQR/2Median vs True Pt



# Comparing Regressed Mass

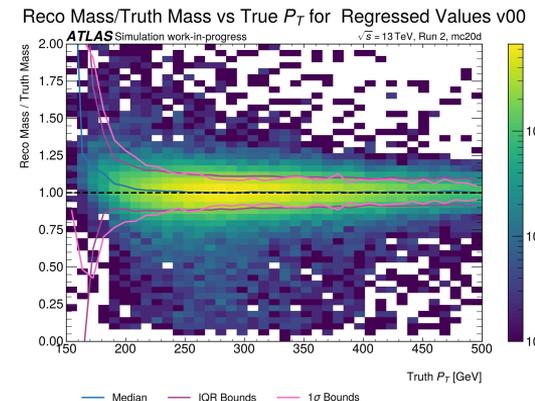
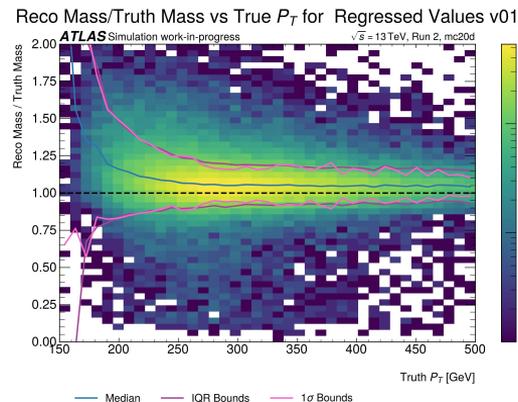
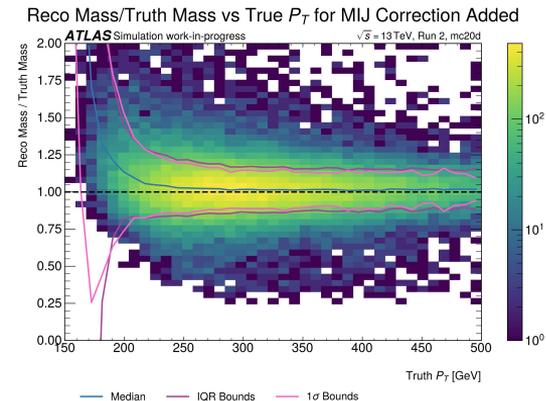
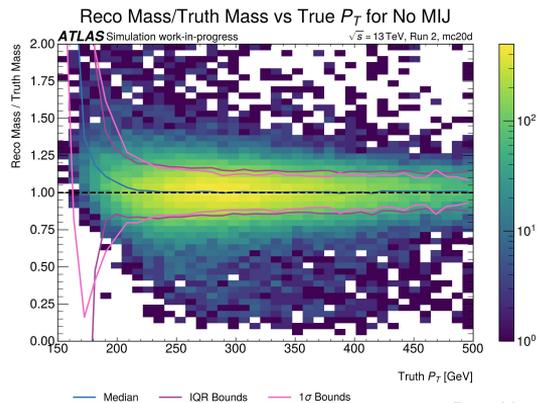
- Truth in the denominator here **does** include muons



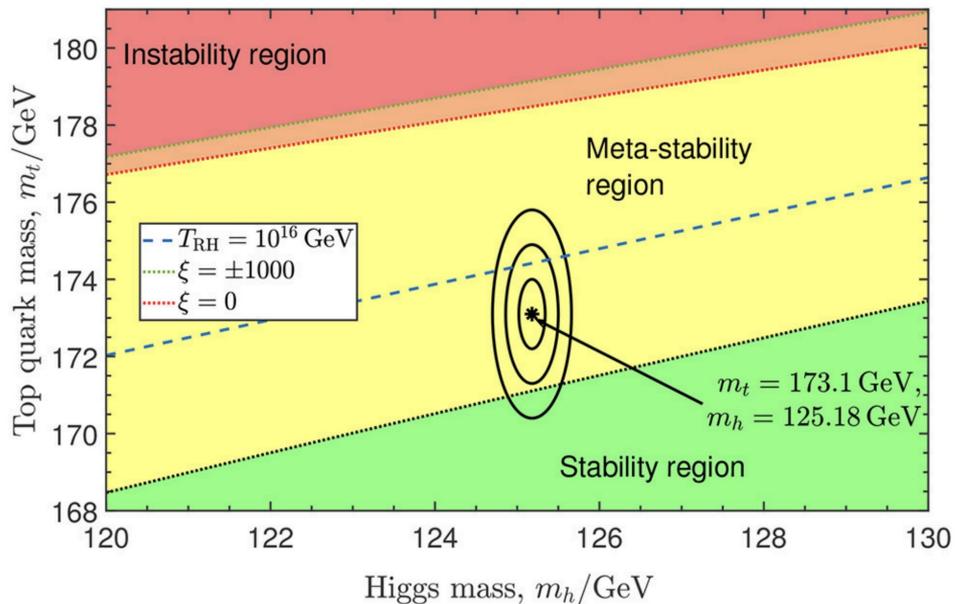
# Comparing Regressed Mass (Older Data)



- Truth in the denominator here does **not** include muons



# (In)stability of the universe



Source: [Markkanen, Rajantie, Stopyra](#)

# GN2X Model Full Inputs



Jet Input	Description
$p_T$	Large- $R$ jet transverse momentum
$\eta$	Signed large- $R$ jet pseudorapidity
mass	Large- $R$ jet mass
Track Input	Description
$q/p$	Track charge divided by momentum (measure of curvature)
$d\eta$	Pseudorapidity of track relative to the large- $R$ jet $\eta$
$d\phi$	Azimuthal angle of the track, relative to the large- $R$ jet $\phi$
$d_0$	Closest distance from track to primary vertex (PV) in the transverse plane
$z_0 \sin \theta$	Closest distance from track to PV in the longitudinal plane
$\sigma(q/p)$	Uncertainty on $q/p$
$\sigma(\theta)$	Uncertainty on track polar angle $\theta$
$\sigma(\phi)$	Uncertainty on track azimuthal angle $\phi$
$s(d_0)$	Lifetime signed transverse IP significance
$s(z_0 \sin \theta)$	Lifetime signed longitudinal IP significance
nPixHits	Number of pixel hits
nSCTHits	Number of SCT hits
nIBLHits	Number of IBL hits
nBLHits	Number of B-layer hits
nIBLShared	Number of shared IBL hits
nIBLSplit	Number of split IBL hits
nPixShared	Number of shared pixel hits
nPixSplit	Number of split pixel hits
nSCTShared	Number of shared SCT hits
subjIndex	Integer label of which subjet track is associated to (GN2X + Subjets only)

Subjet Input	Description (Used only in GN2X + Subjets)
$p_T$	Subjet transverse momentum
$\eta$	Subjet signed pseudorapidity
mass	Subjet mass
energy	Subjet energy
$d\eta$	Pseudorapidity of subjet relative to the large- $R$ jet $\eta$
$d\phi$	Azimuthal angle of subjet relative to the large- $R$ jet $\phi$
GN2 $p_b$	$b$ -jet probability of subjet tagged using GN2
GN2 $p_c$	$c$ -jet probability of subjet tagged using GN2
GN2 $p_u$	light flavour jet probability of subjet tagged using GN2
Flow Input	Description (Used only in GN2X + Flow)
$p_T$	Transverse momentum of flow constituent
energy	Energy of flow constituent
$d\eta$	Pseudorapidity of flow constituent relative to the large- $R$ jet $\eta$
$d\phi$	Azimuthal angle of flow constituent relative to the large- $R$ jet $\phi$

Source: [ATL-PHYS-PUB-2023-021](https://arxiv.org/abs/2302.021)