

Taggers for boosted HH searches within the ATLAS experiment



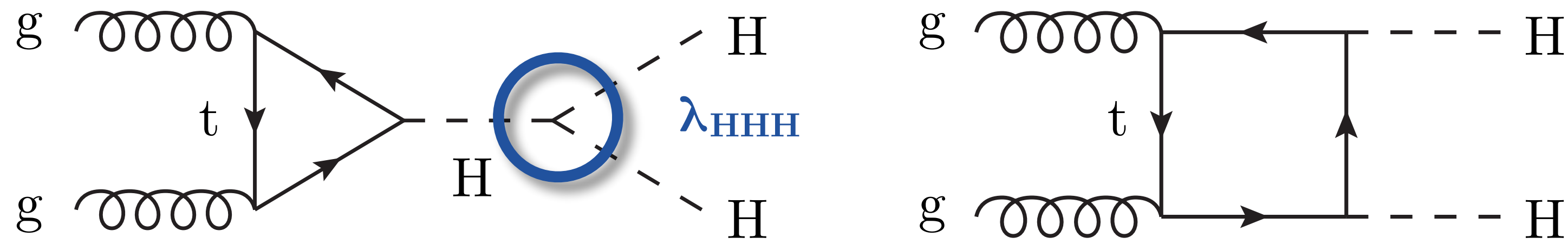
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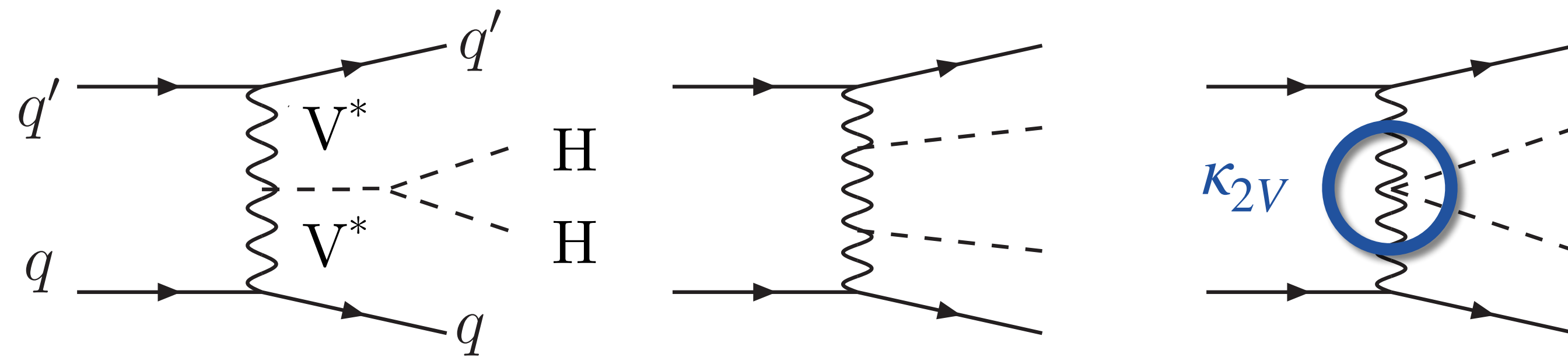
February 28th, 2024

1st COMETA general meeting - İzmir

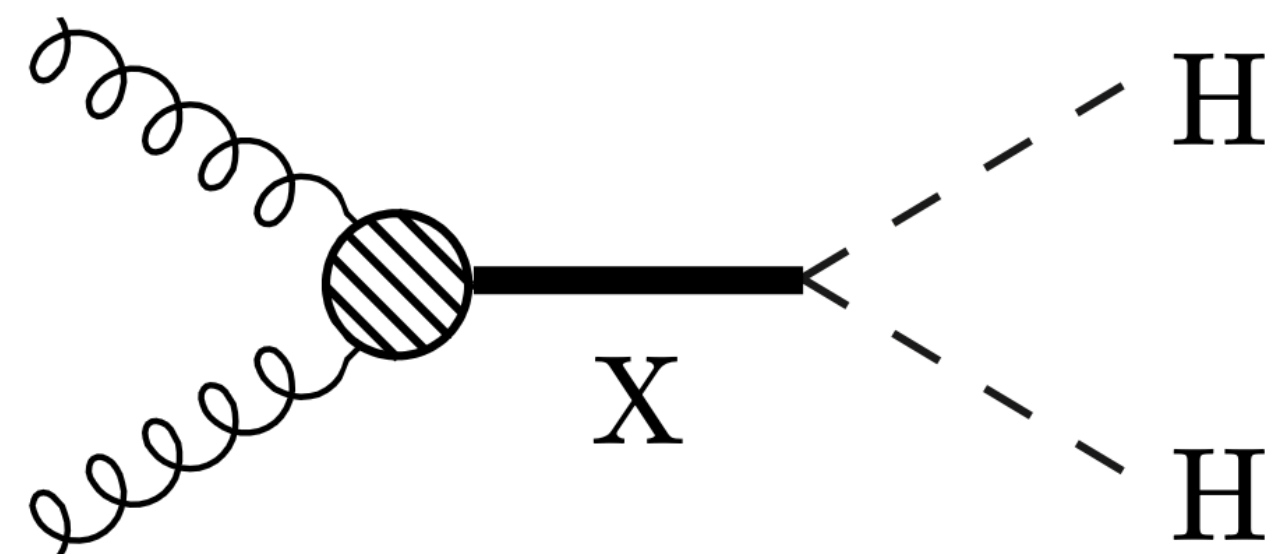
HH physics motivations



Gluon fusion
SM HH signal
Self-coupling (κ_λ),
EFT

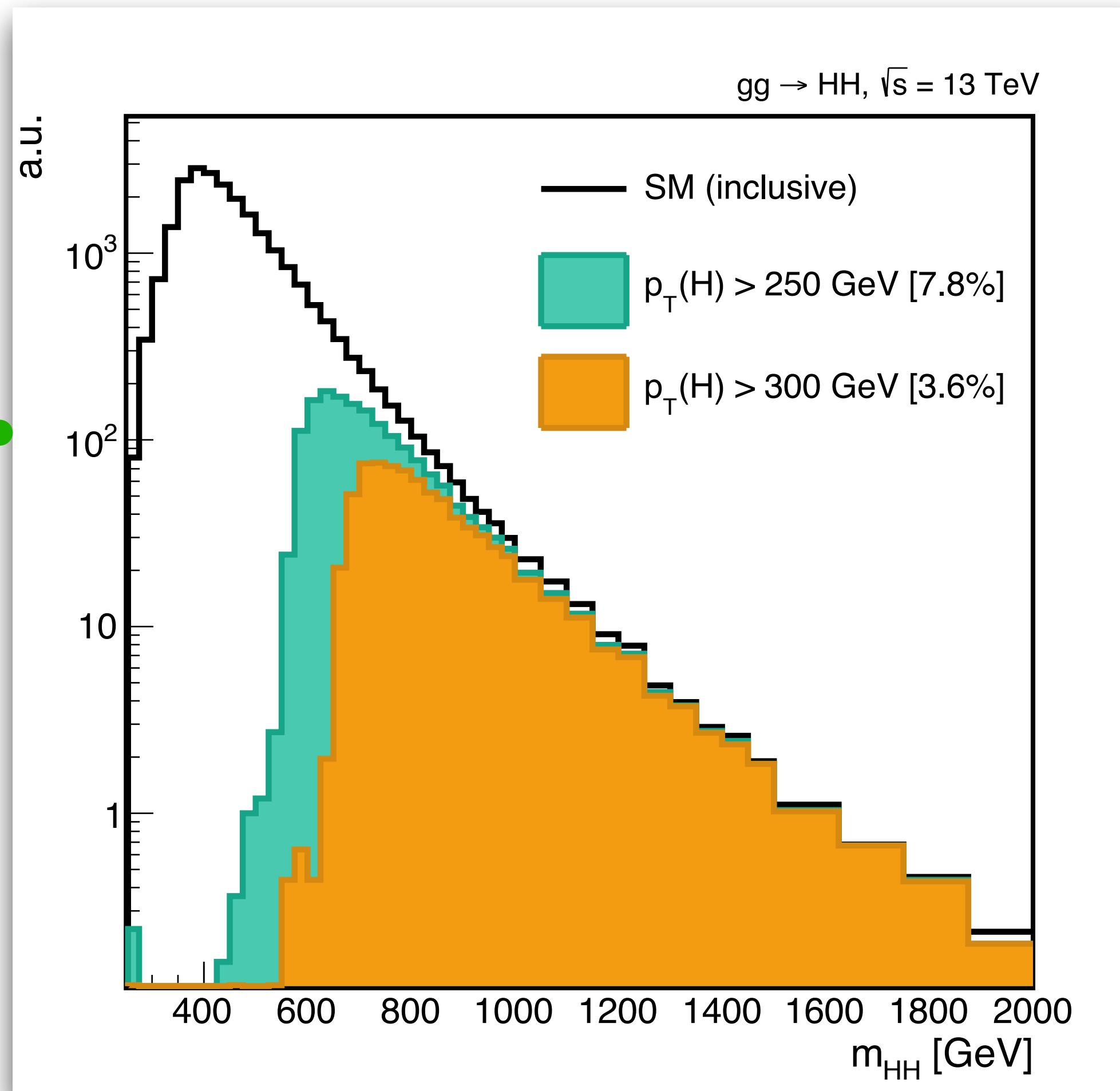
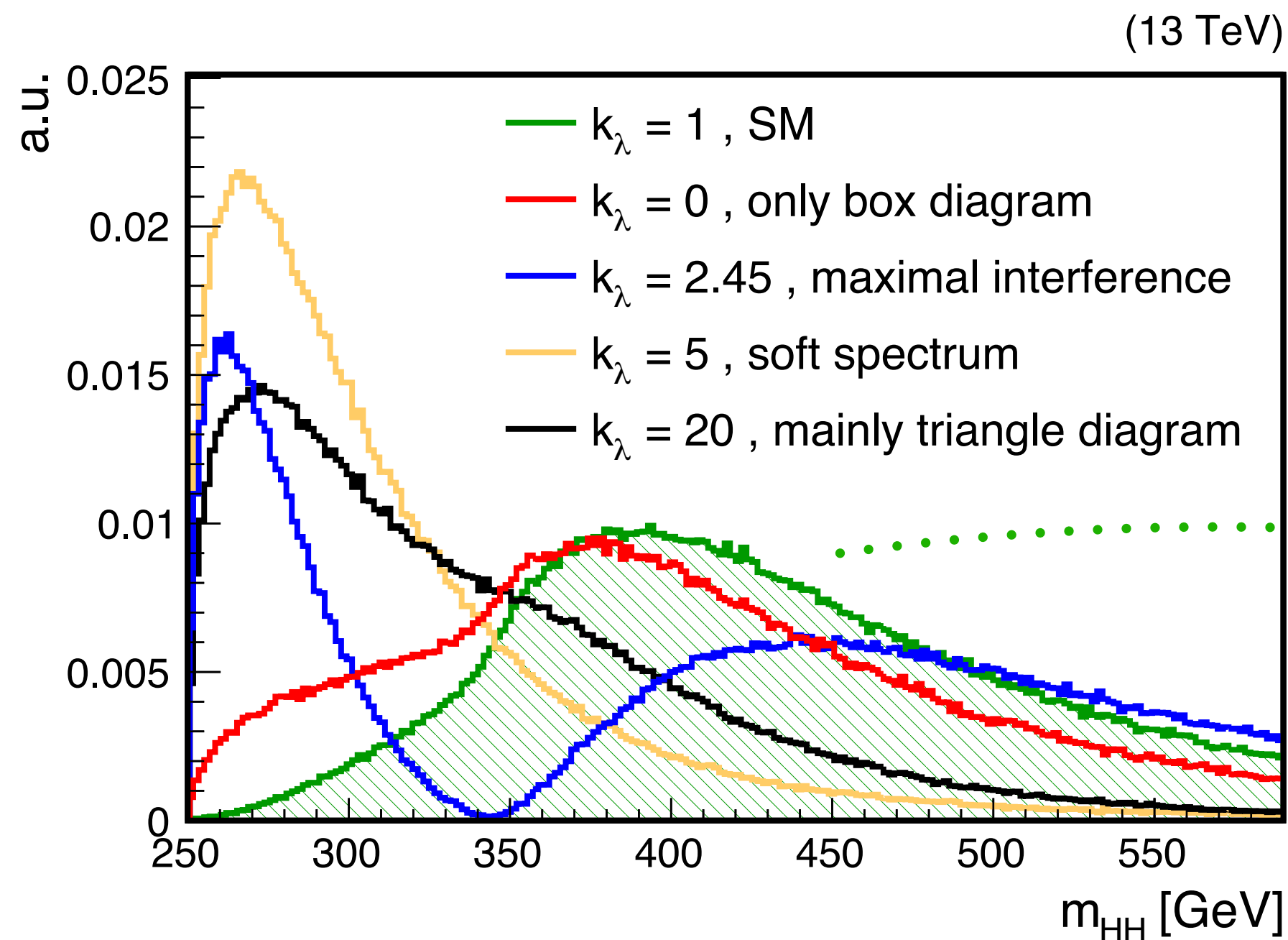


Vector boson fusion
VVHH coupling (κ_{2V})



Resonant production
New heavy states

Boosted HH in ggF production



- SM has one of the hardest m_{HH} spectra (κ_λ effects typically at threshold)

Tiny phase space portion that can provide advantageous S/B separation

Gluon fusion

SM HH signal
Self-coupling (κ_λ),
EFT

Vector boson fusion

VVHH coupling (κ_{2v})

Resonant production

New heavy states

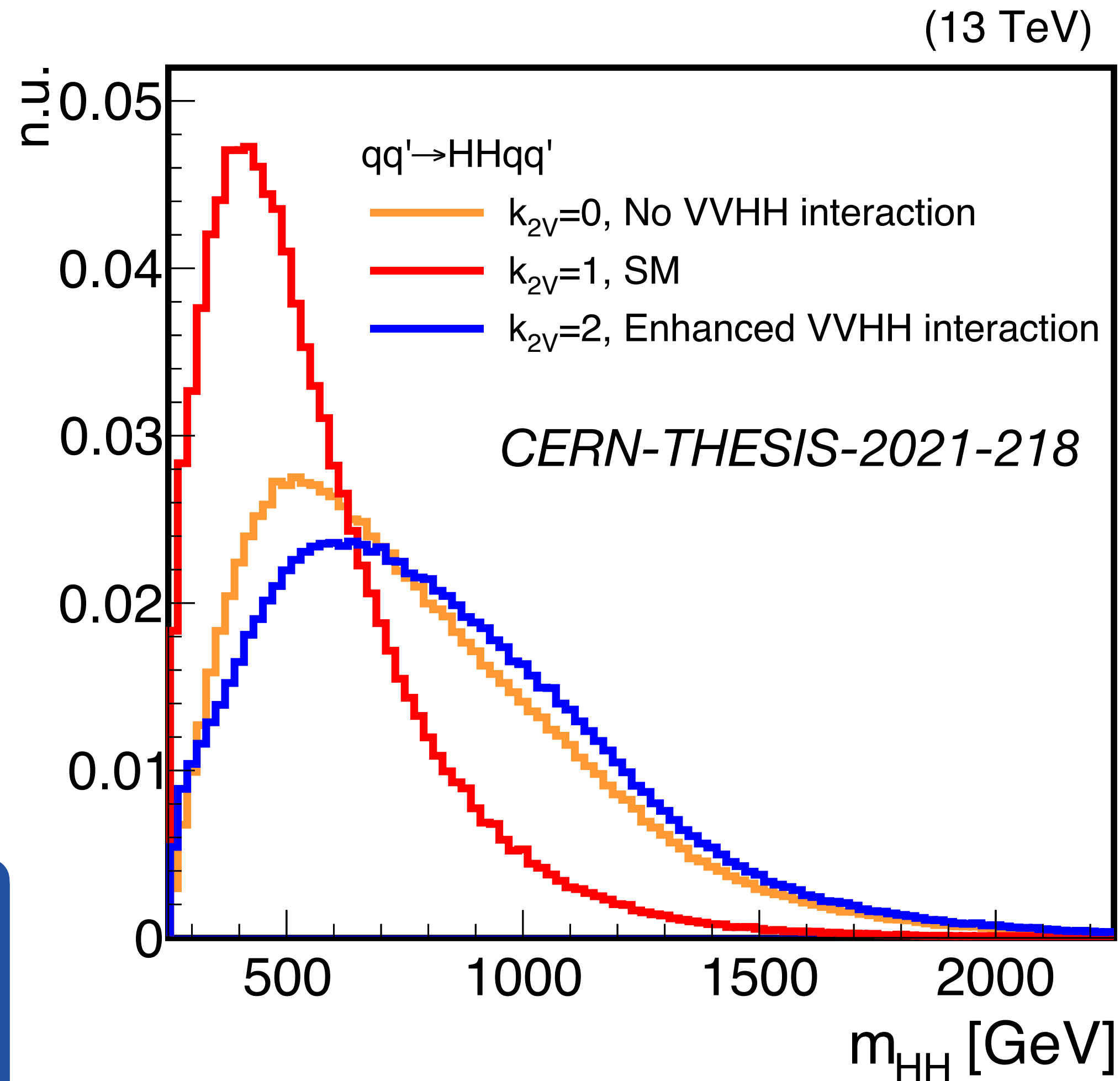
Boosted HH in VBF production

$$\mathcal{A}(V_L V_L \rightarrow HH) \simeq \frac{\hat{s}}{v^2} (\kappa_{2V} - \kappa_V^2)$$

EPJC 77 (2017) 7, 481

- Very large changes in m_{HH} with $O(1)$ κ_{2V} variations because of alterations in the cancellations from electroweak doublet structure

Dominant boosted production in case of anomalous couplings



Gluon fusion

SM HH signal
Self-coupling (κ_λ),
EFT

Vector boson fusion

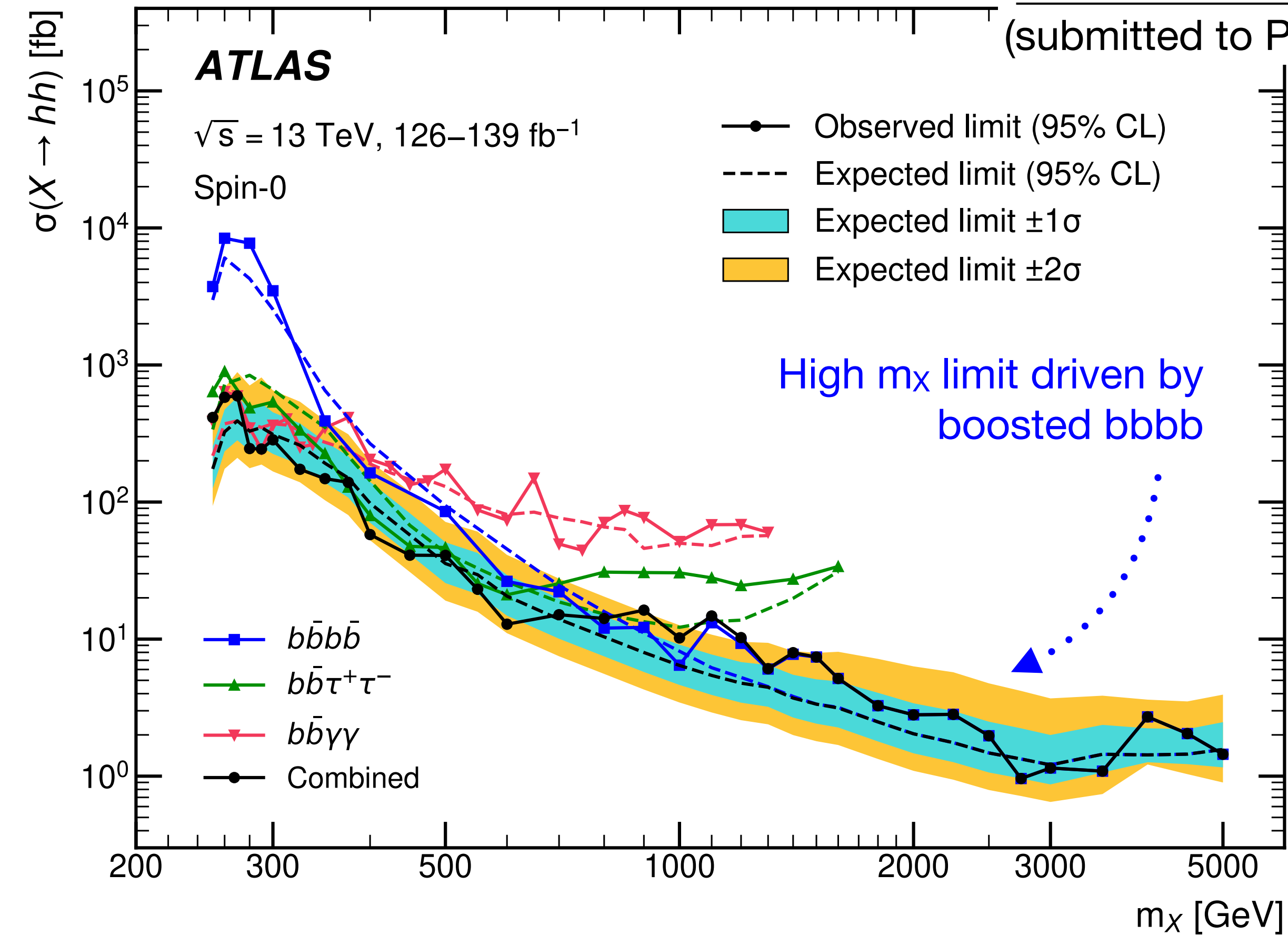
VVHH coupling (κ_{2V})

Resonant production

New heavy states

Boosted HH in resonant production

arXiv:2311.15956
(submitted to PRL)



- Resonant searches span a broad m_X range
- High mass resonances result in highly boosted H bosons
- Boosted H tagging is fundamental to explore $m_X > 1 \text{ TeV}$

Gluon fusion

SM HH signal
Self-coupling (κ_λ),
EFT

Vector boson fusion

VVHH coupling (κ_{2V})

Resonant production

New heavy states

Boosted topologies naturally dominant at high m_X

Which final state for boosted HH?

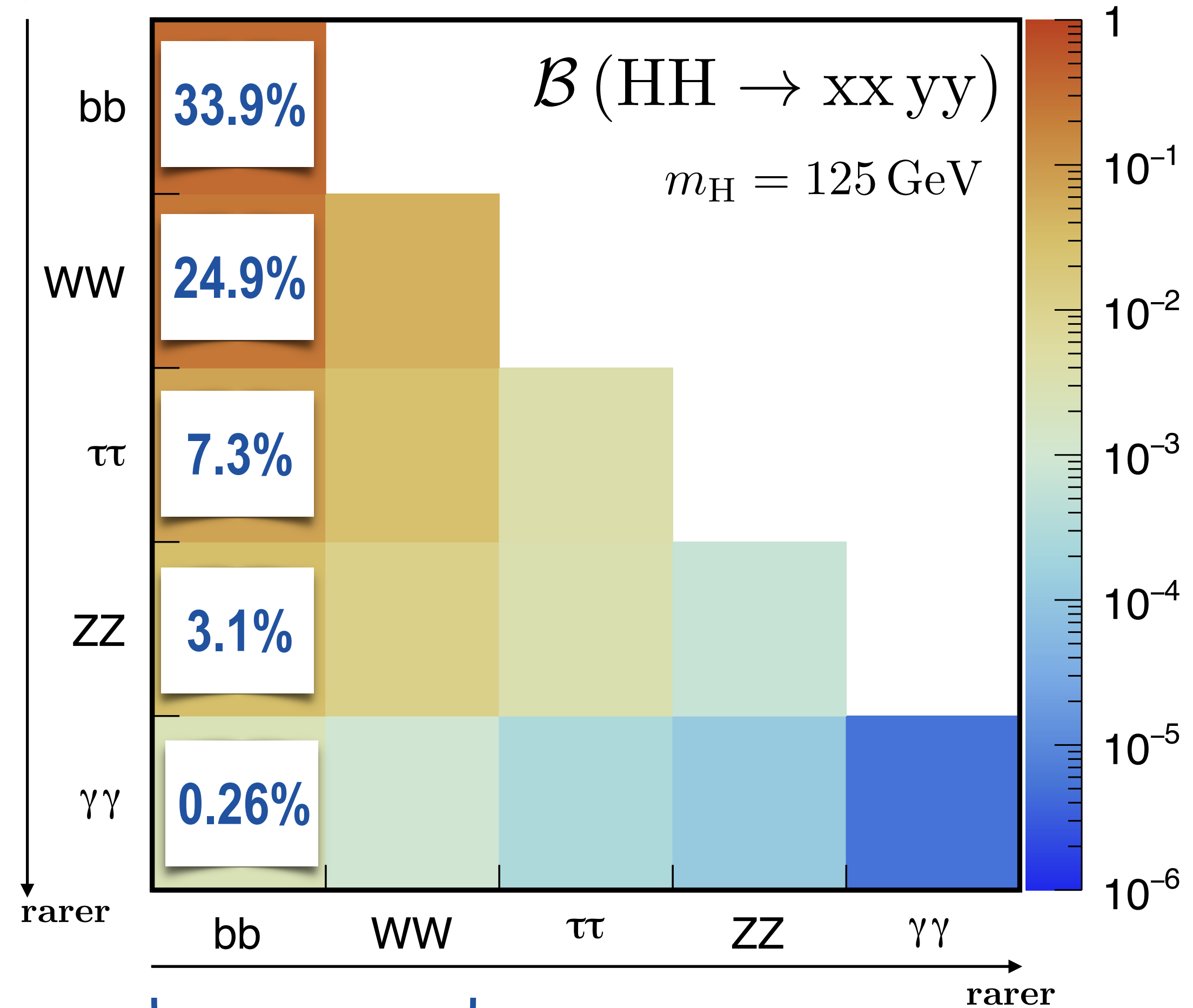
- HH searches span a broad set of final states
- Boosted topologies usually identify a small portion of the phase space (ggF) or feature small cross sections (VBF, resonant)
- High BR channels with hadrons most suited for the application of boosted tagging in HH

$H \rightarrow bb/WW/\tau\tau$ final states are particularly interesting for boosted HH searches

Boosted W final states were not yet explored in an ATLAS HH search and hence boosted W tagging is not covered here.

Several boosted W algorithms exist and could be applied for this topology.

XX % : ATLAS public results with full Run 2 data set



Trade-off between \mathcal{B} and purity

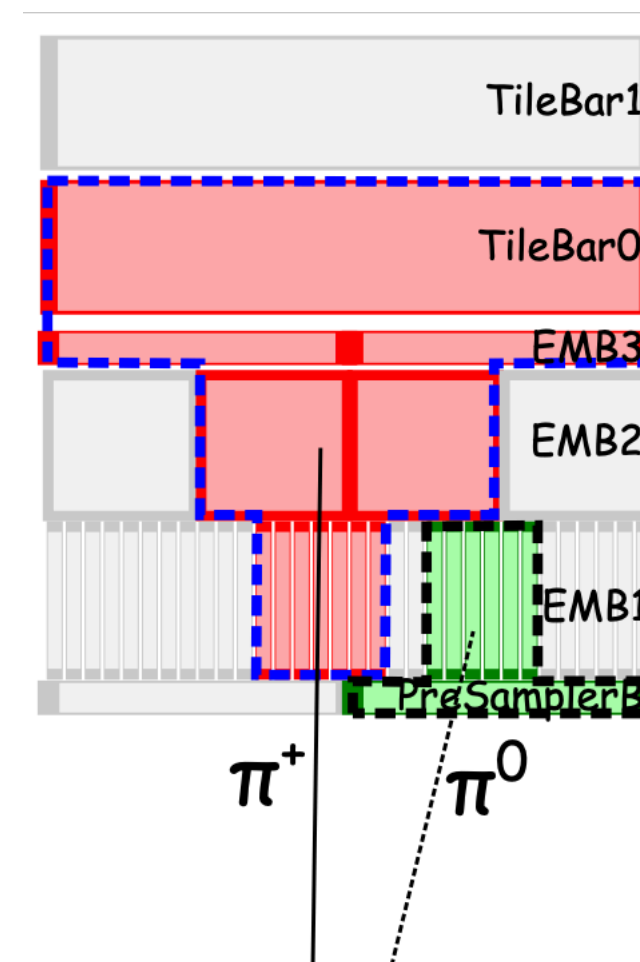
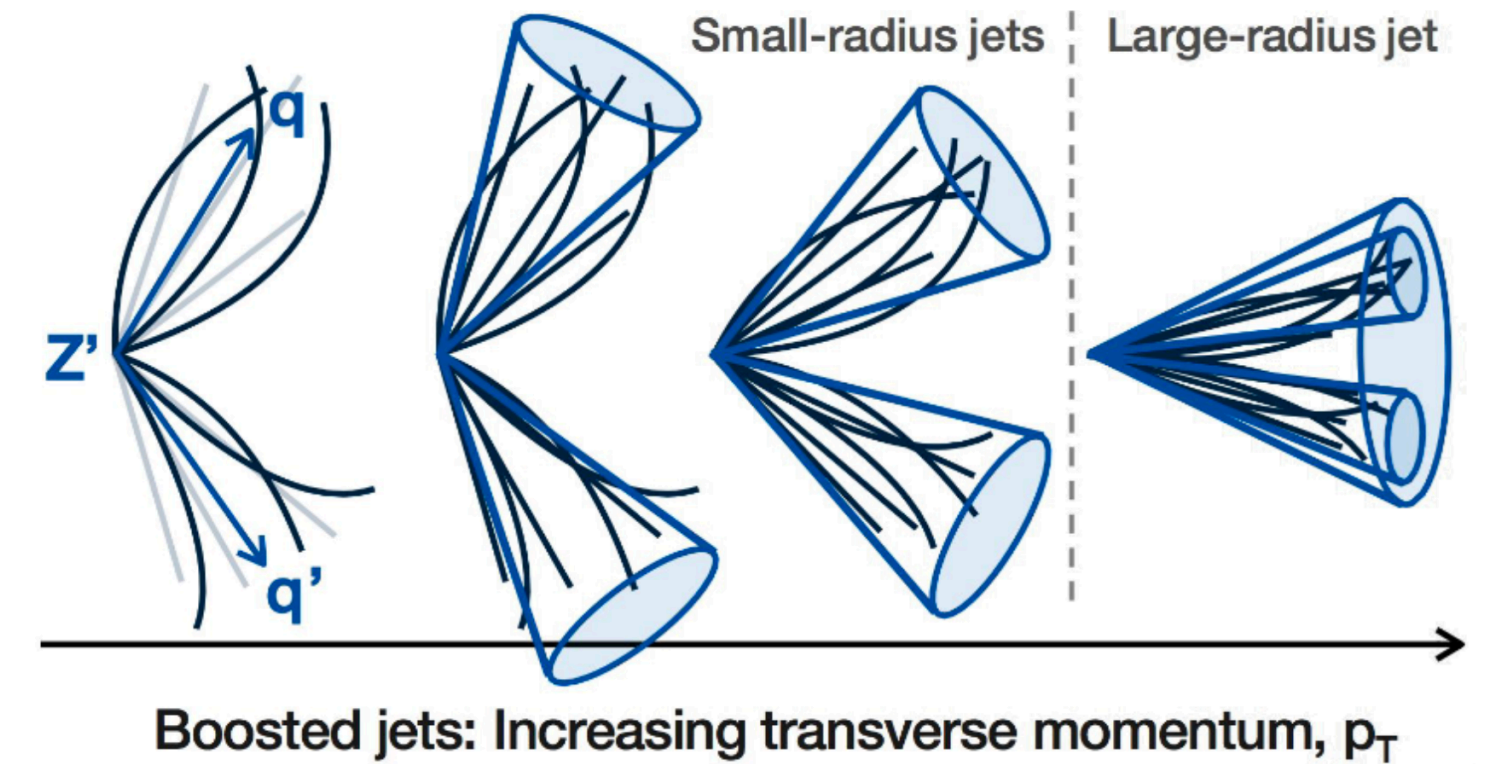
Keep \mathcal{B} high enough

Boosted tagging inputs : UFO jets

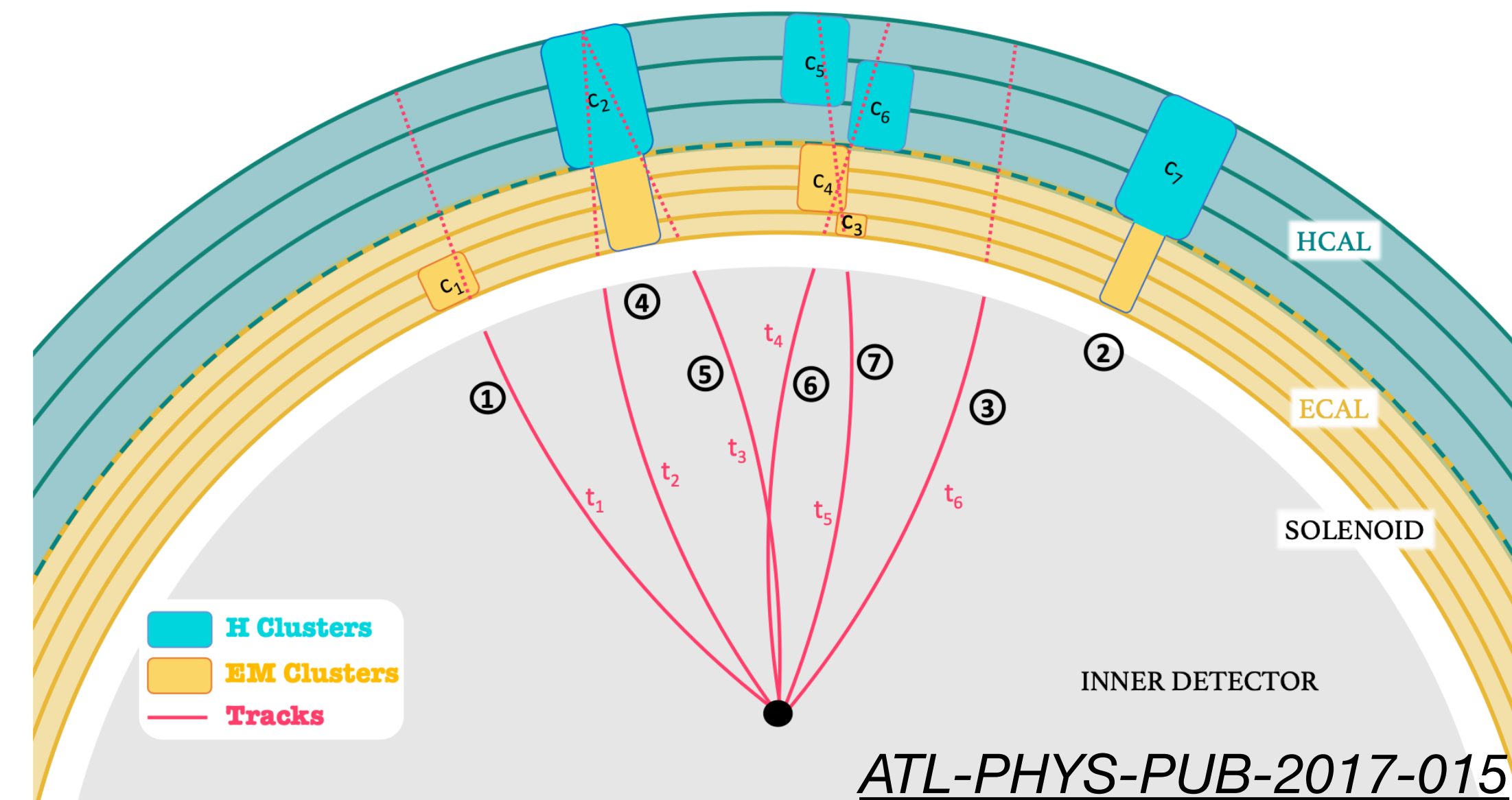
- Unified Flow Objects jets combine optimally calorimeter and tracker information ([EPJC 81 \(2021\) 4, 334](#))
 - Particle Flow Objects (PFO) : particle energy estimation from track subtracted from calo cluster
 - Track-Calo Cluster (TCC) : energy from calo cluster + η, ϕ information from tracks
 - dedicated pileup mitigation and jet grooming

Input constituents as close as possible to individual physics particles

Clustering done with $R = 1$
 $\Delta R \sim 2m/p_T \rightarrow$ for Higgs, boosted reconstruction from $p_T(H) \approx 250$ GeV
 Subjects identified by clustering constituents as variable radius (VR) jets with $R = \rho/p_T$



[EPJC 77 \(2017\) 466](#)



[ATL-PHYS-PUB-2017-015](#)

Outline of boosted bb taggers

Taggers improve quickly following the technical evolutions in the field

Two main taggers are described in the following

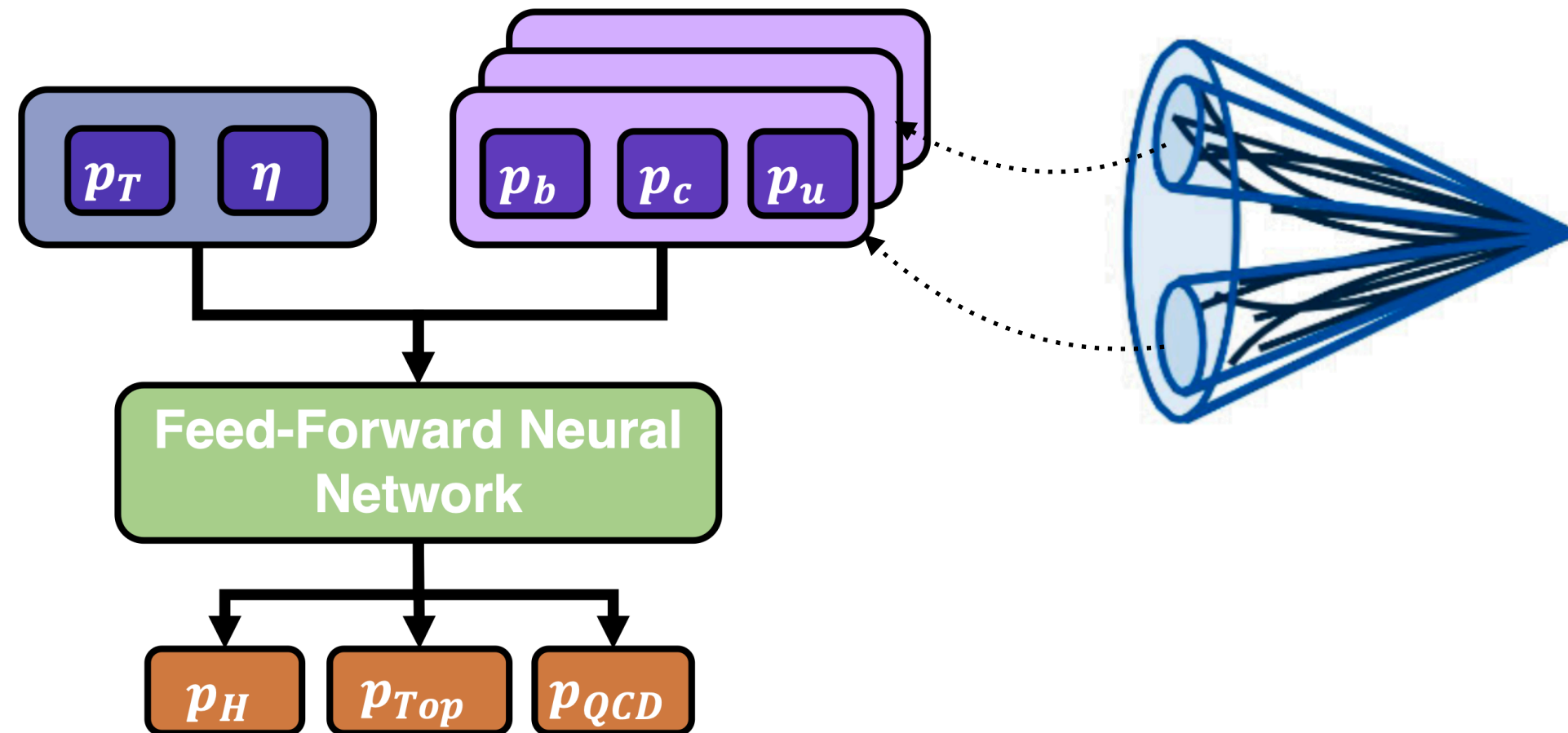
- Xbb tagger
 - feed-forward NN that combined flavour tagging discriminants from subjets
 - calibrated on ATLAS Run 2 data
 - used in most of the Run 2 results
- GN2X tagger
 - most recent development
 - uses low-level information from jet constituents in a GNN / Transformer network architecture

The comparison of their performance illustrates the power of going towards constituent-based taggers

Xbb tagger

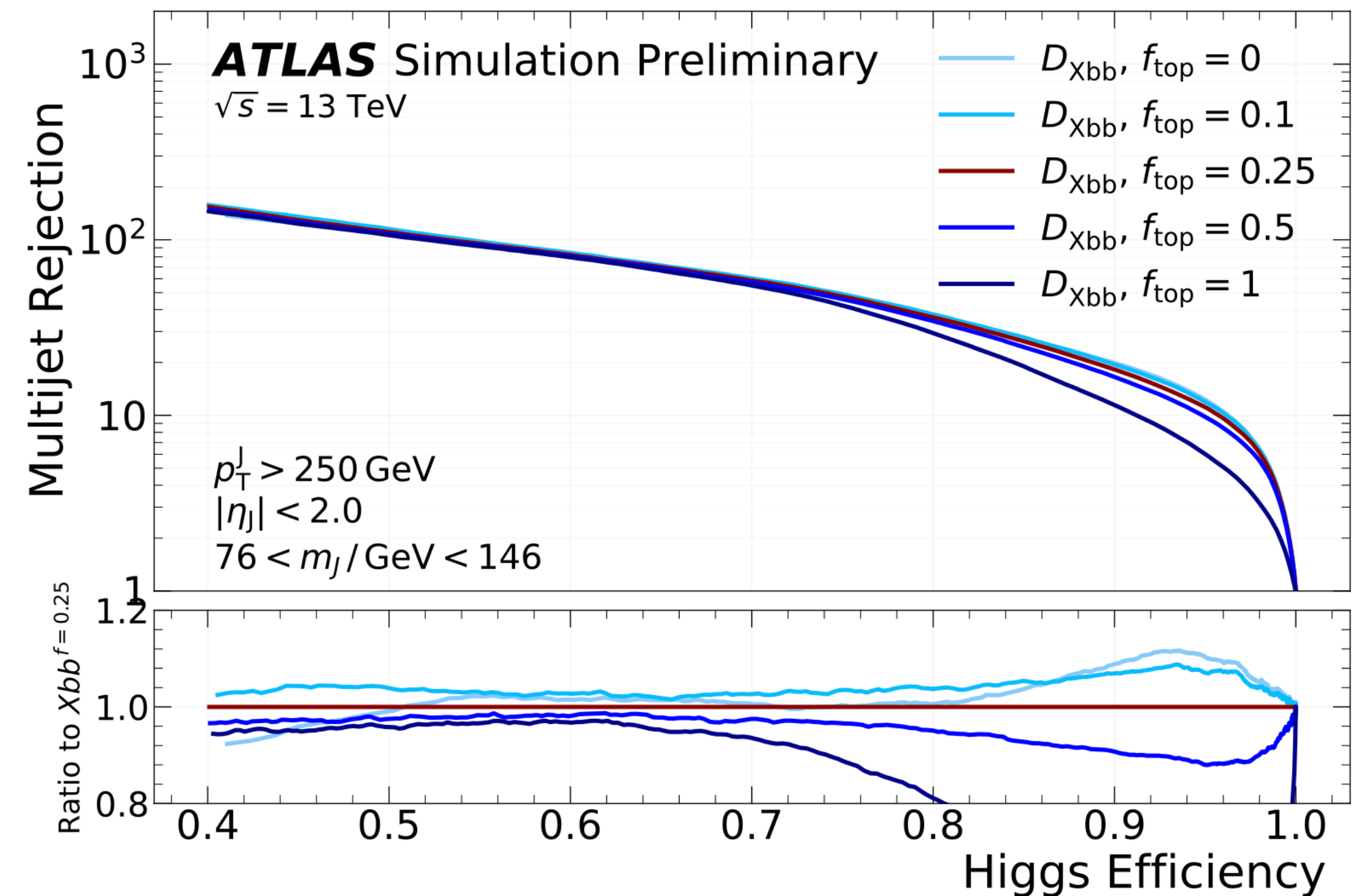
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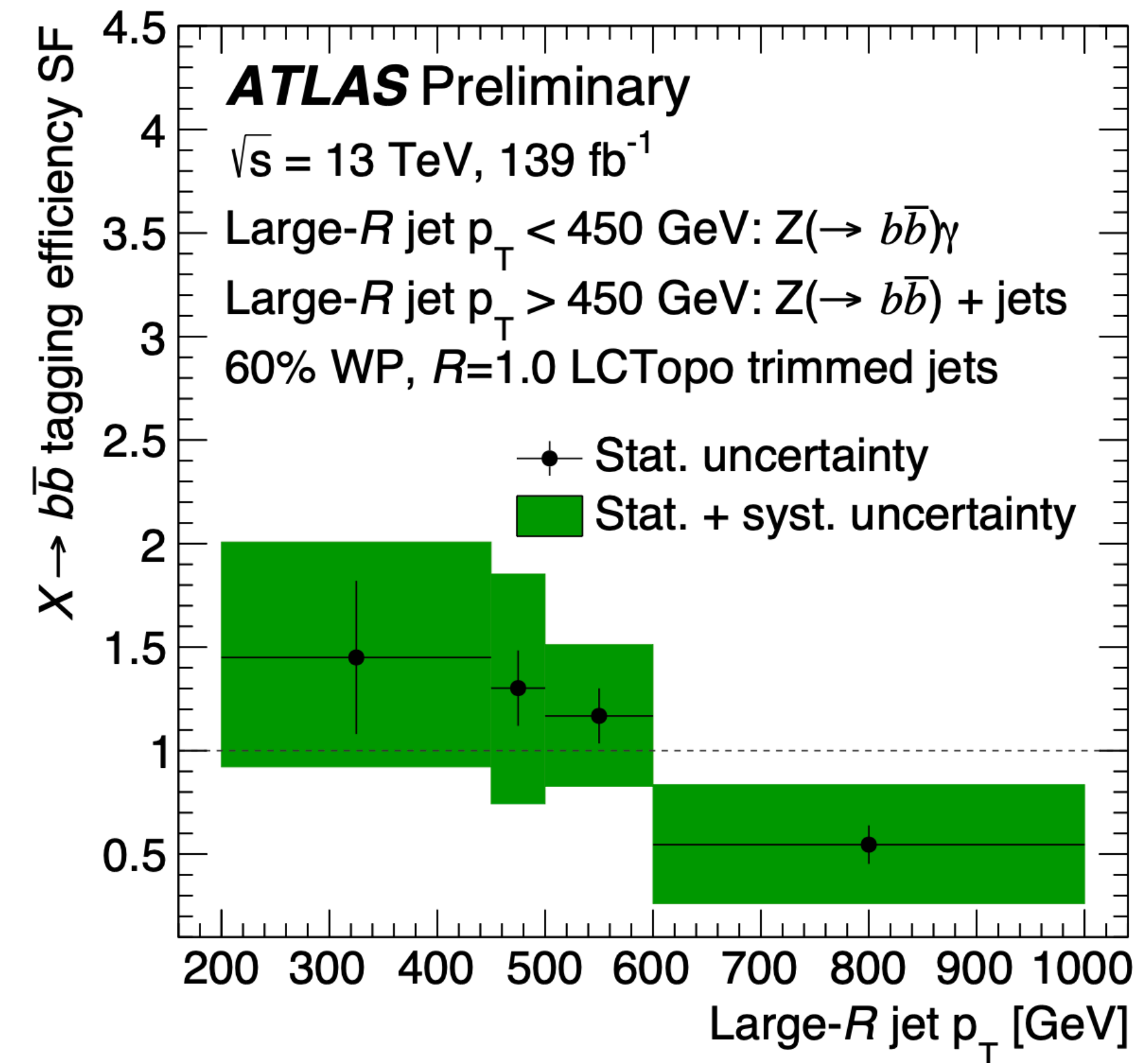
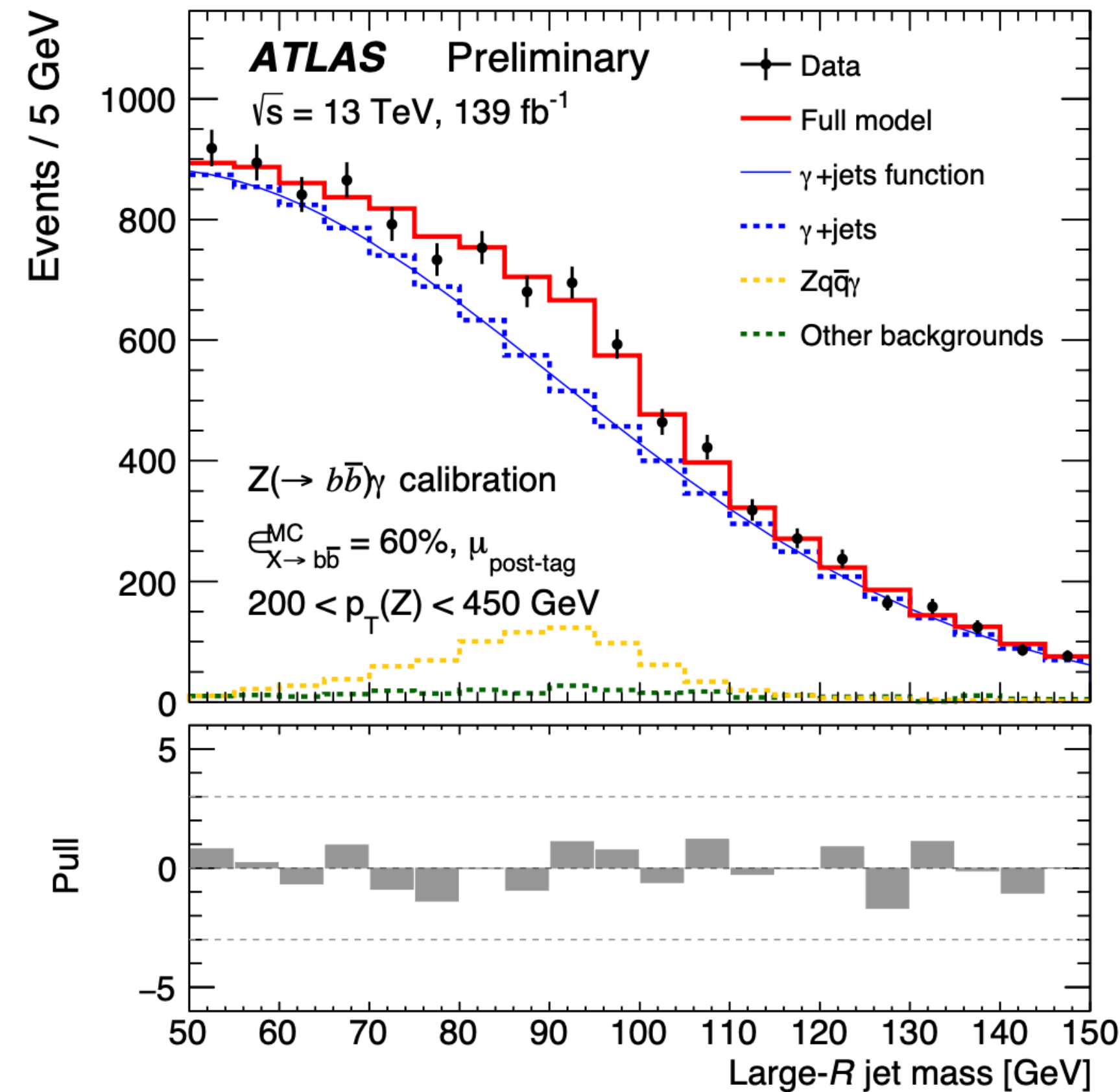
- Individual subjets are tagged using single b-tagging DL1r algorithm (DNN) optimised for VR jets
- Jet information + DL1r output nodes of max 3 subjets are fed to Xbb

$$D_{Xbb} = \ln \frac{P_{Higgs}}{f_{top} \cdot p_{top} + (1 - f_{top}) \cdot p_{multijet}}$$



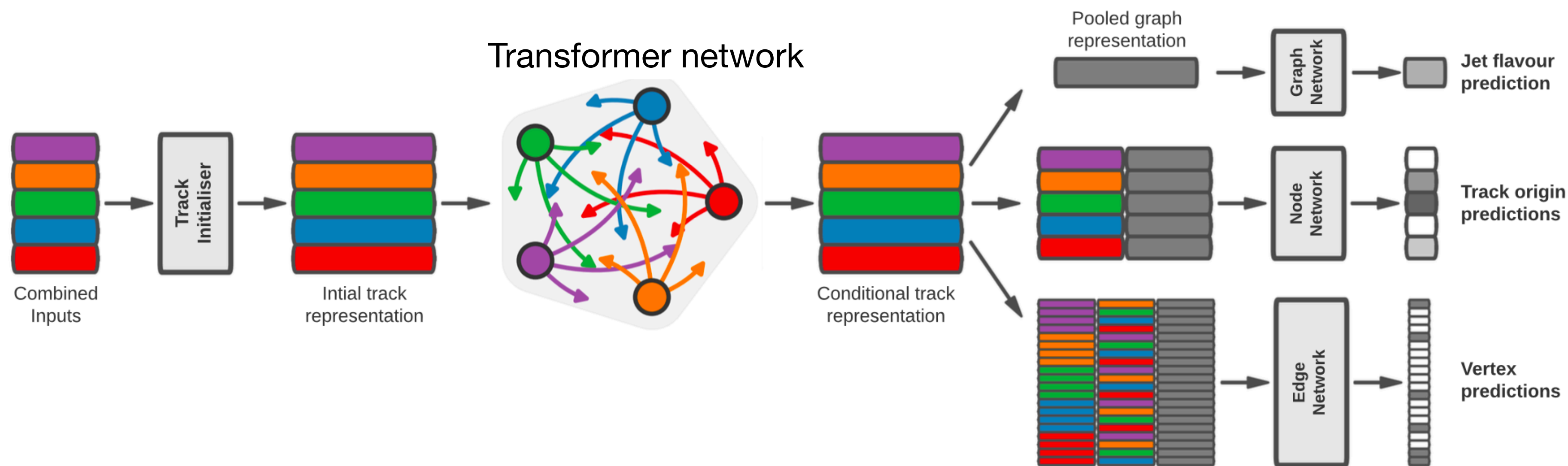
Xbb tagger calibration

- Signal calibration on Z(bb)+jets and Z(bb) γ
- Background calibration on tt events
- Validation on $g \rightarrow bb$ events



GN2X

ATL-PHYS-PUB-2022-027



Large jet features : $p_T/\eta/m$

*20 low-level track features
(momentum, geometry,
quality)*

*Embedding
representation*

*Transformer
Encoder*

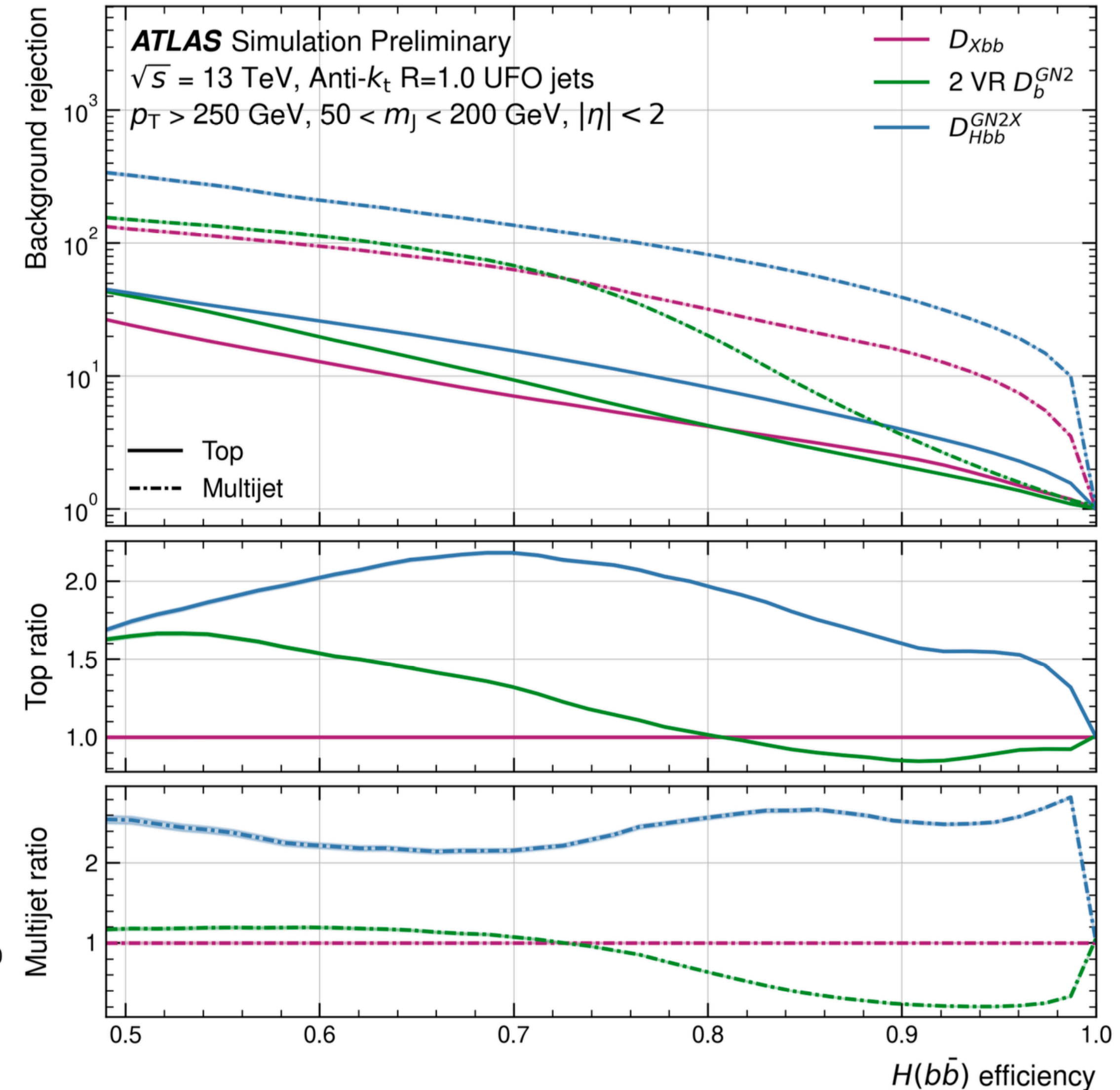
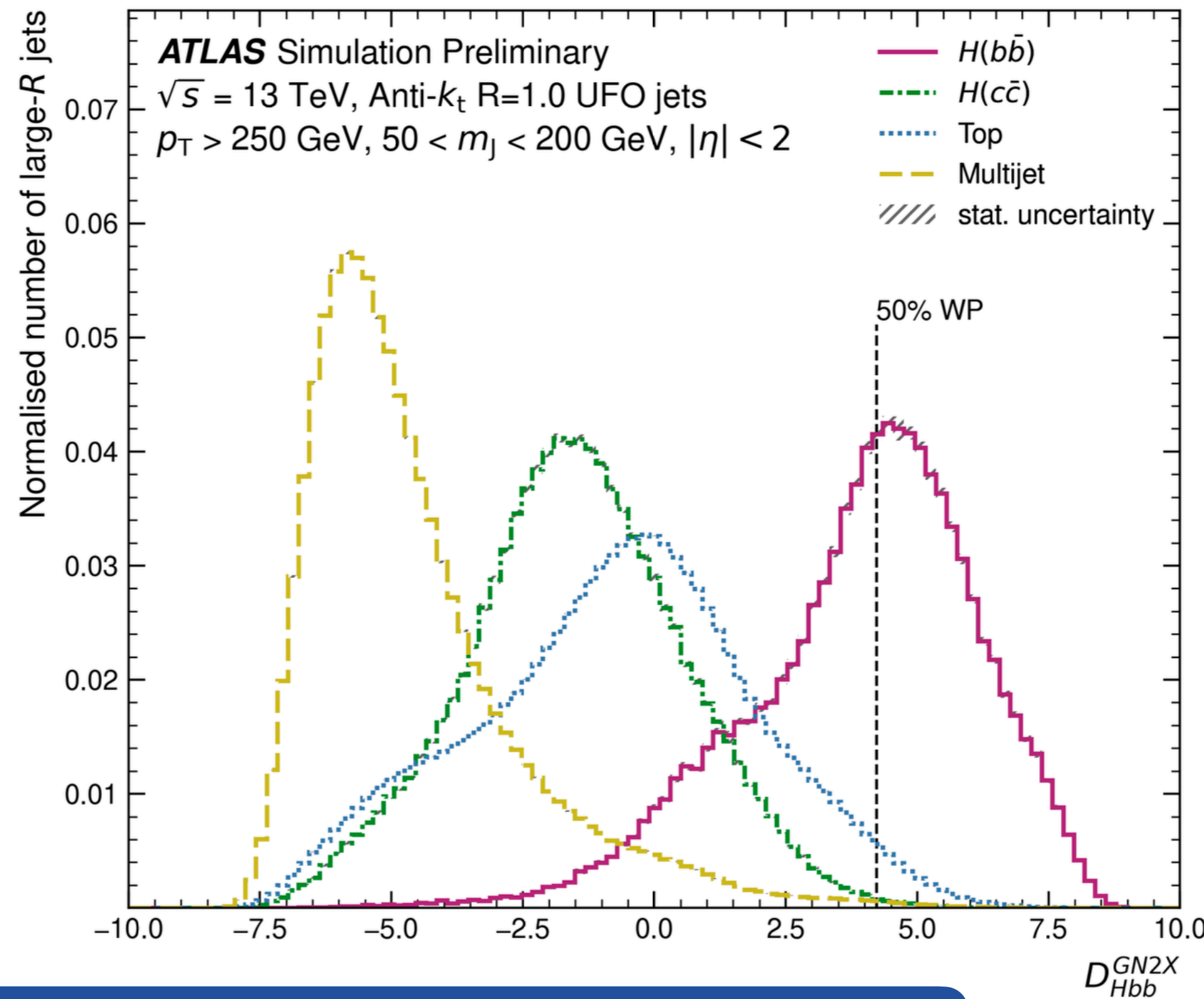
*Primary task (jet flavour identification) +
auxiliary tasks*

- Evolution of GN1 architecture (based on GNN)
- 4 target flavour classes (bb, cc, top, QCD)
- Training done on ~60M jets

Performance

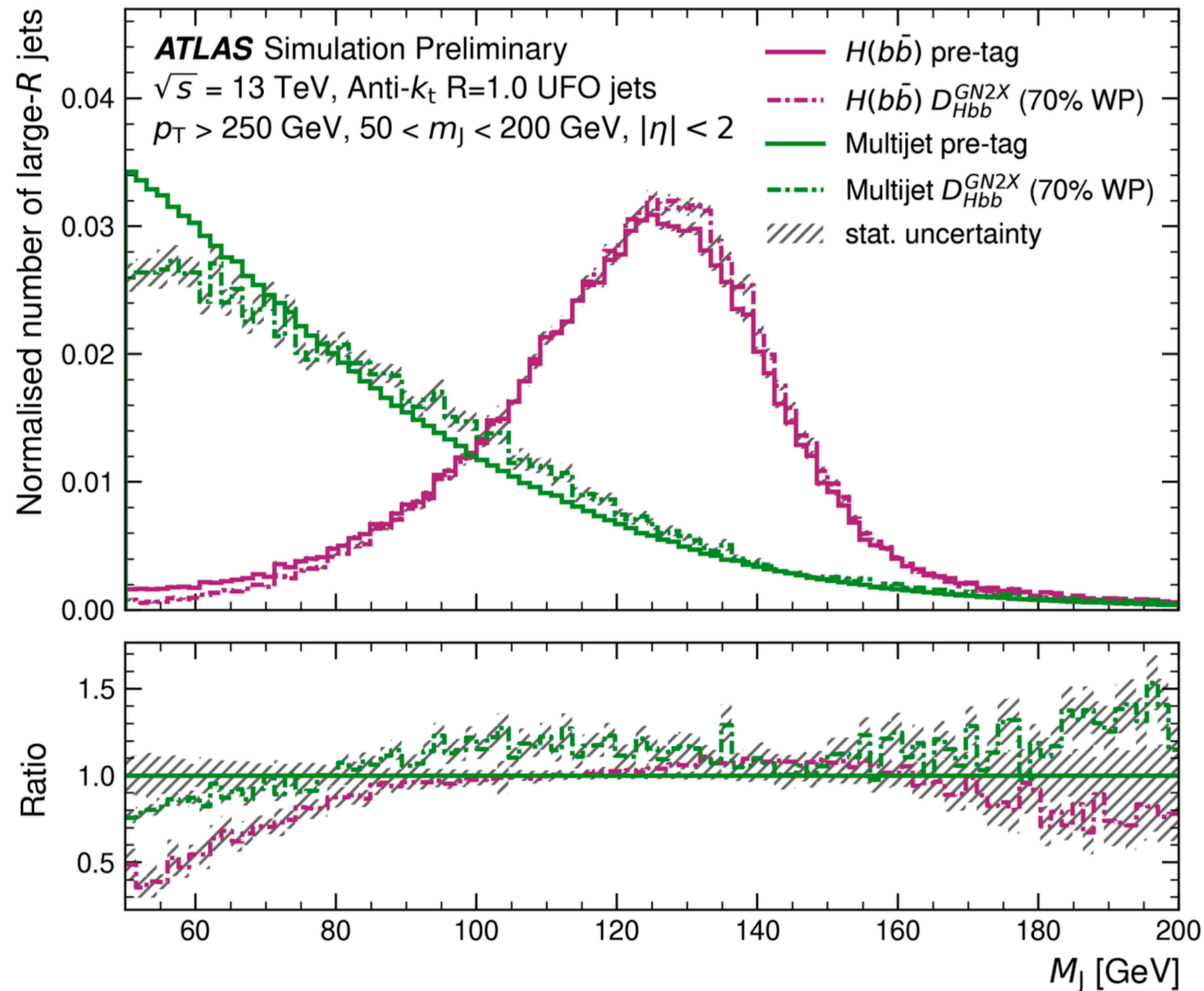
$$D_{Hbb}^{GN2X} = \ln \left(\frac{p_{Hbb}}{f_{Hcc} \cdot p_{Hcc} + f_{top} \cdot p_{top} + (1 - f_{Hcc} - f_{top}) \cdot p_{QCD}} \right)$$

- GN2X vs Xbb: importance of low-level information
- GN2X vs 2 VR GN2 : importance of correlations across subjects



GN2X outperforms previous taggers

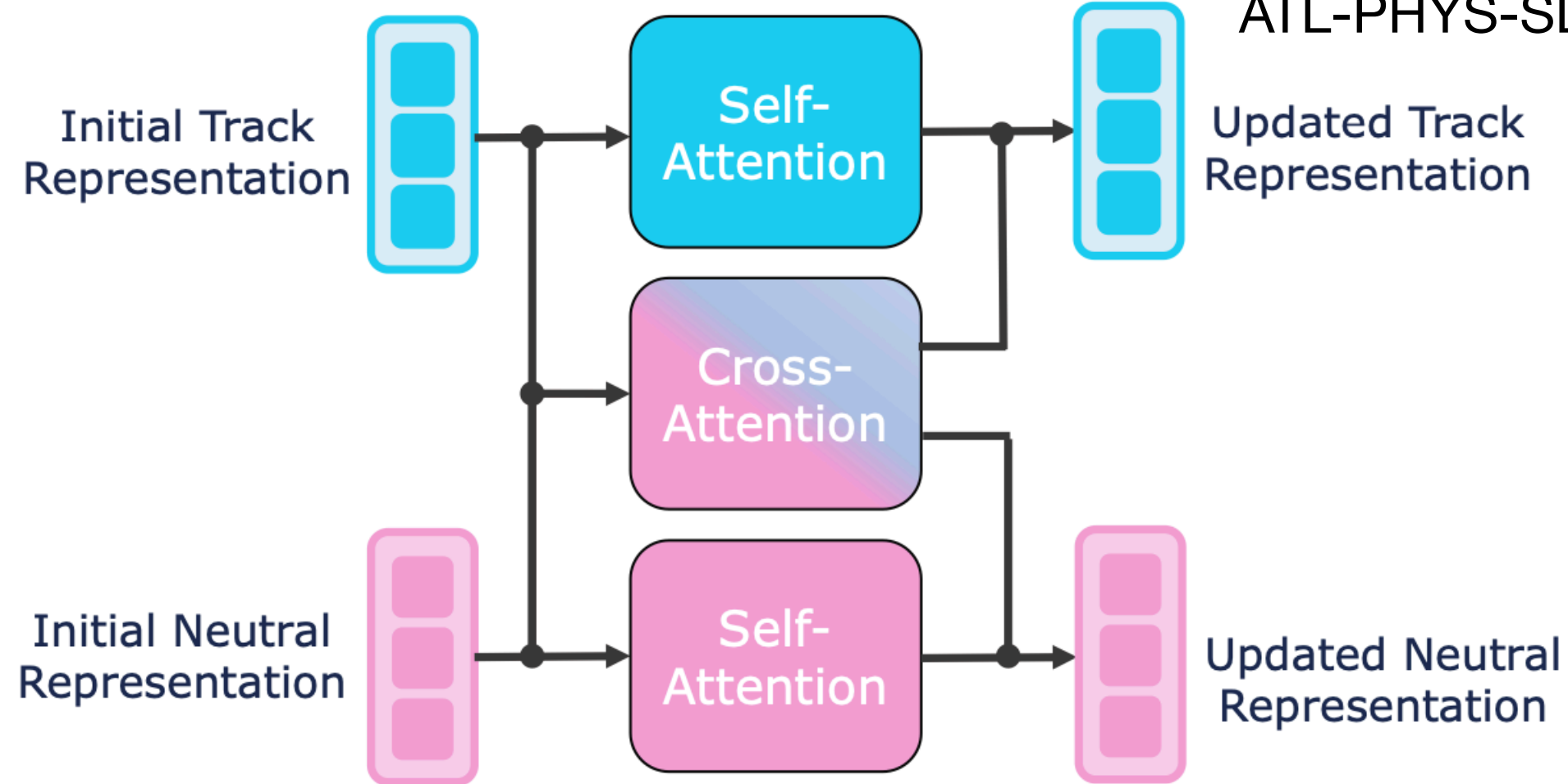
Mass sculpting



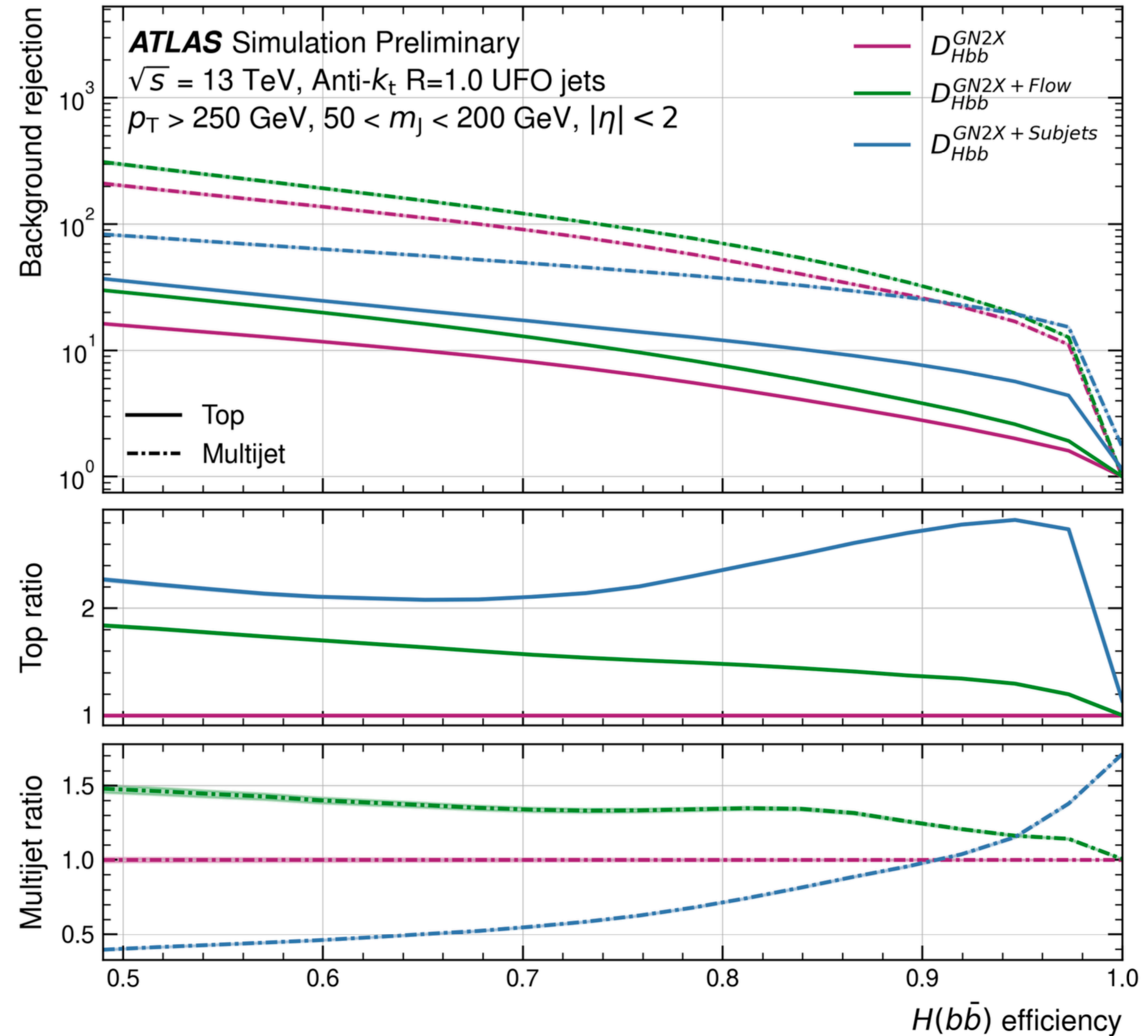
- Effect on the background observed in the edge mass regions
 - training performed with jets of mass [50, 300] GeV
 - approximately flattened signal sample from ZH(bb) and p_T -binned QCD sample

Beyond track information

ATL-PHYS-SLIDE-2023-328



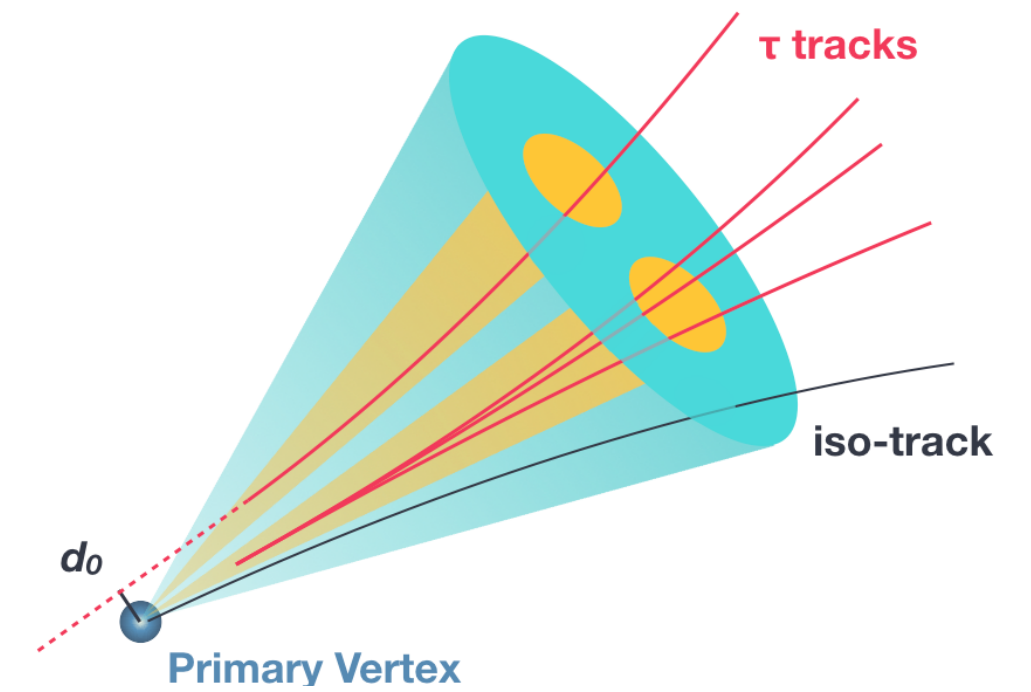
- Inclusion of neutral information (energy flow constituents) and subjet information further improves the performance



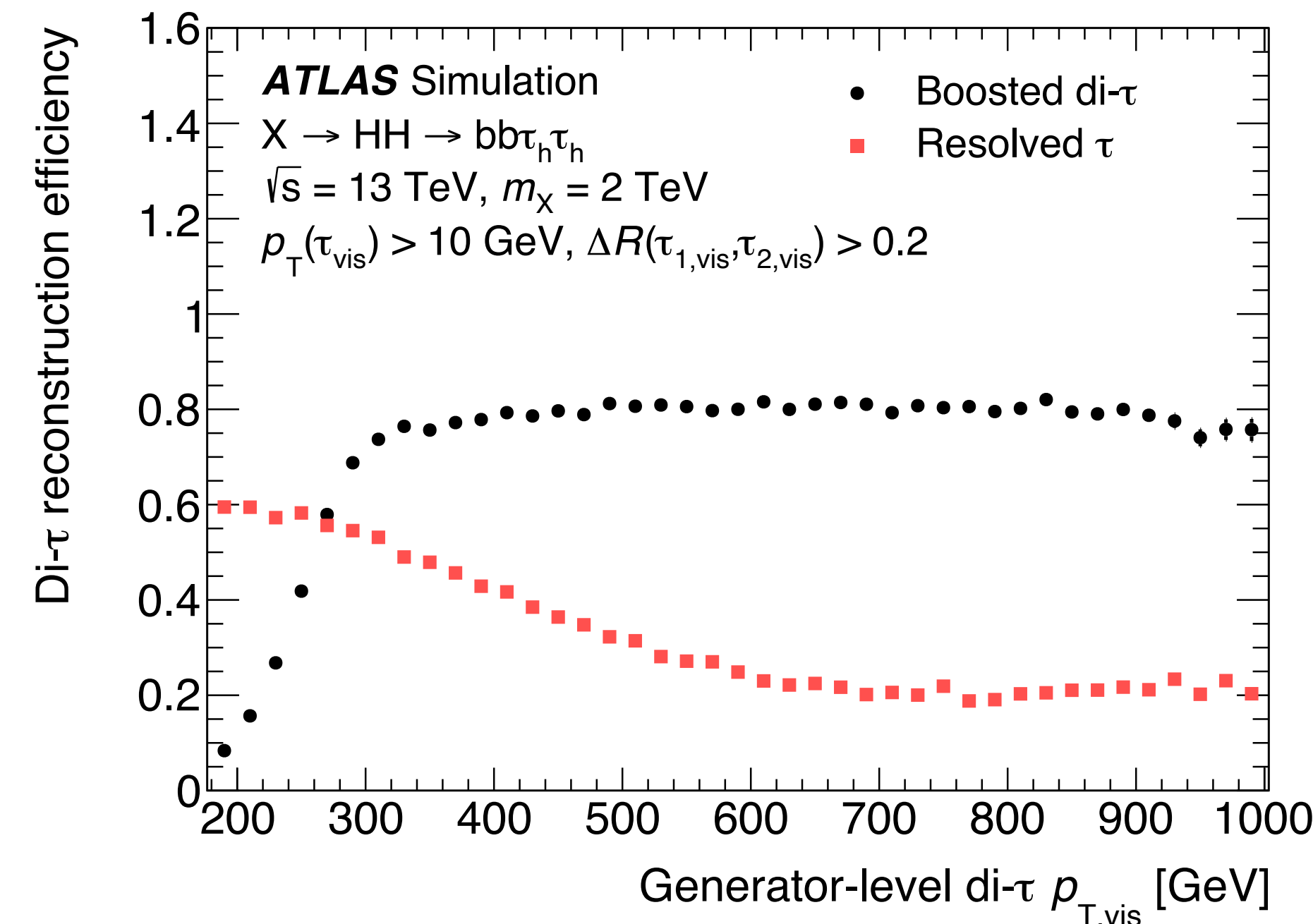
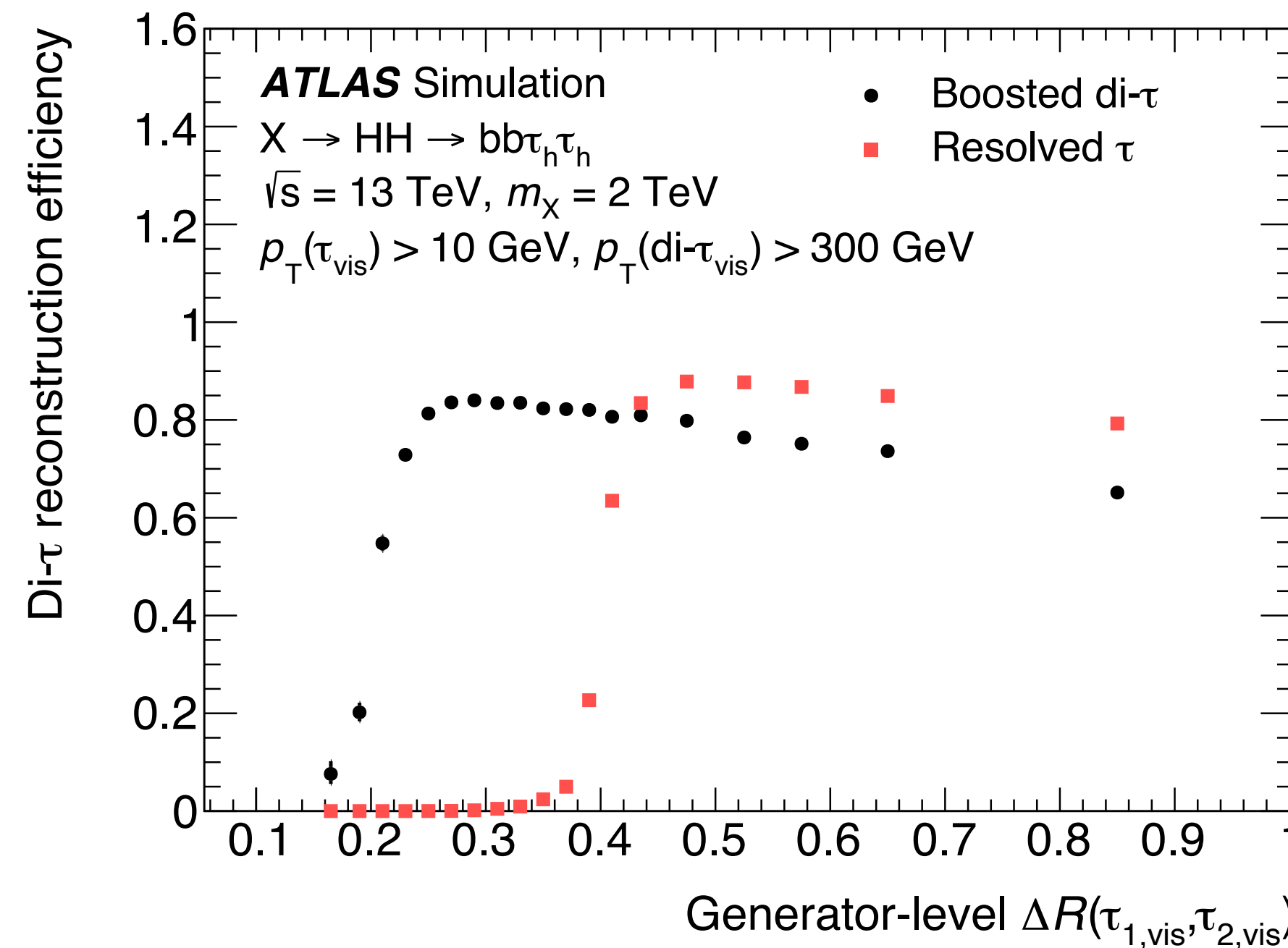
Boosted $H \rightarrow \tau\tau$ reconstruction

Collimated $\tau\tau$ decays mutually affect isolation criteria

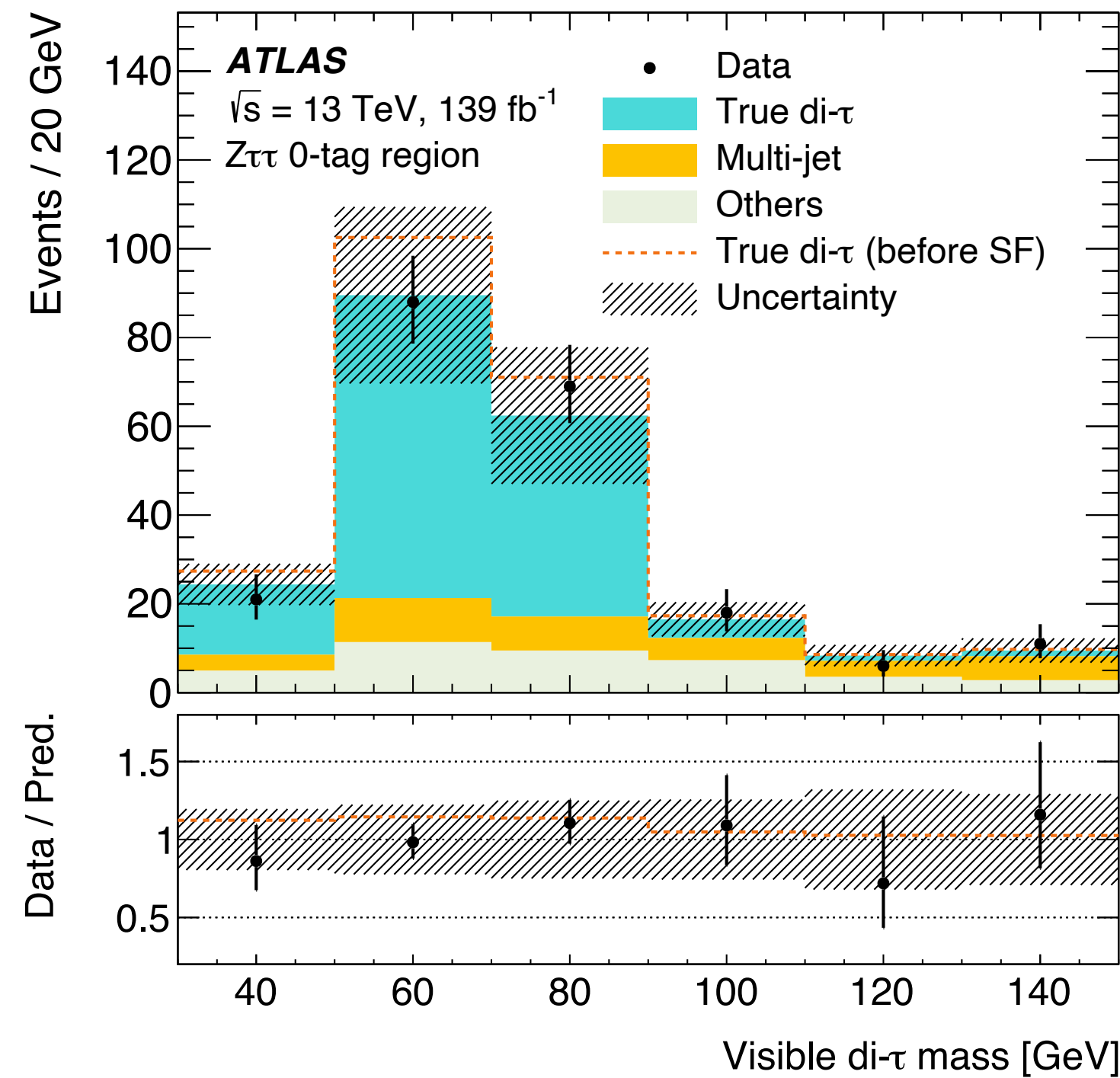
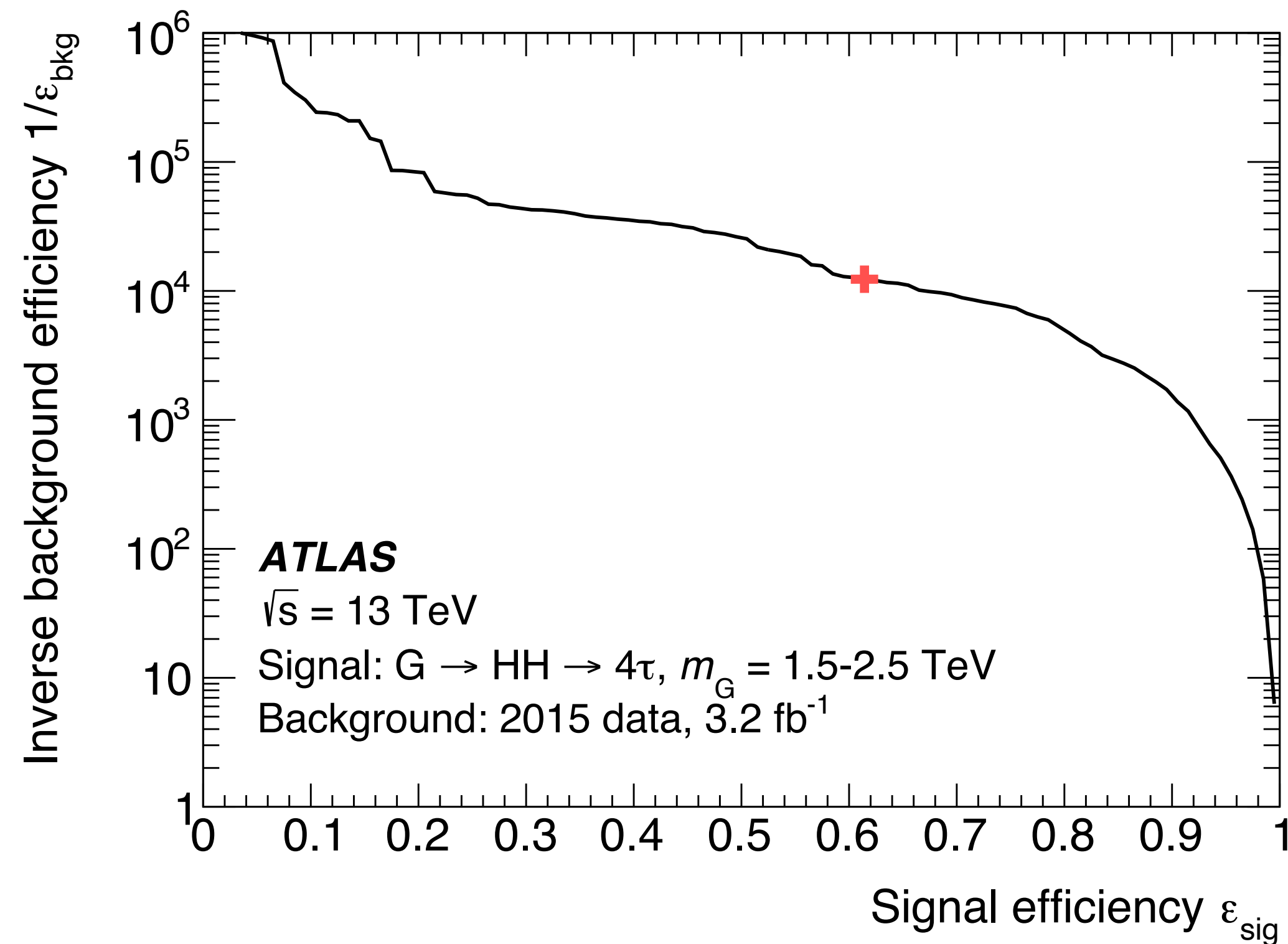
Reconstruction of $\tau_h\tau_h$ as a single $R=1$ jet



- Target $\tau_h\tau_h$ only
- Seeded by $R=1$ jets with $p_T > 300$ GeV
- Constituents reclustered with $R = 0.2$, 2 sub-jets needed
- τ_h reconstructed from tracks matched to sub-jets, residual tracks for isolation



Boosted $H \rightarrow \tau\tau$ identification



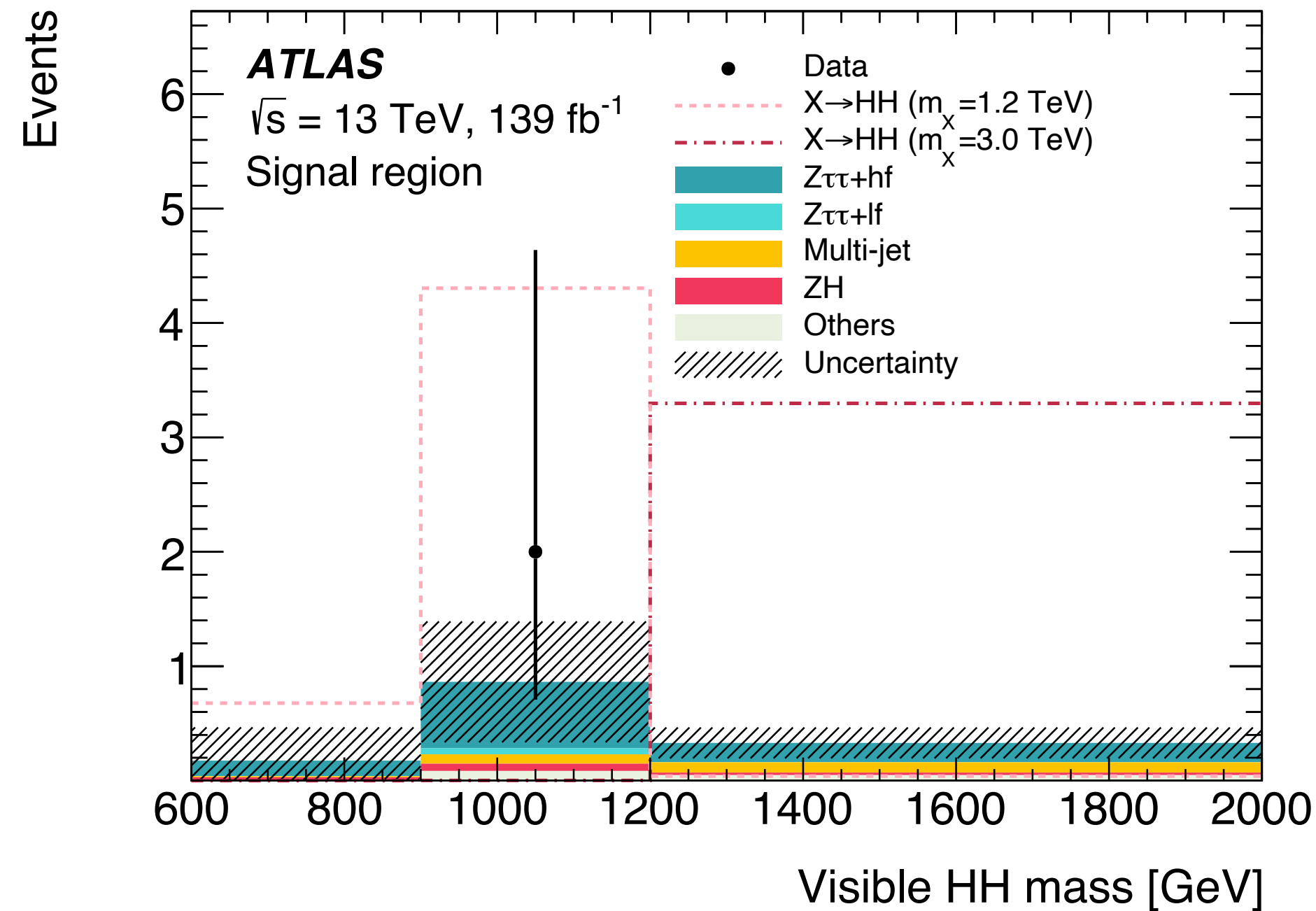
- BDT for identification
 - stable performance vs p_T and pileup
- 17 high-level features
 - multiplicity of tracks, isolation, and distribution of energy between subjets and $R=1$ jet
- Require 1 or 3 tracks in the subjet core to tag $\pi^\pm / \pi^\pm \pi^\mp \pi^\pm$
 - 80% ϵ_{sig} , 5x better bkg. rejection
- Calibration with high p_T $Z \rightarrow \tau\tau$ + b jet veto

BDT-based signal identification

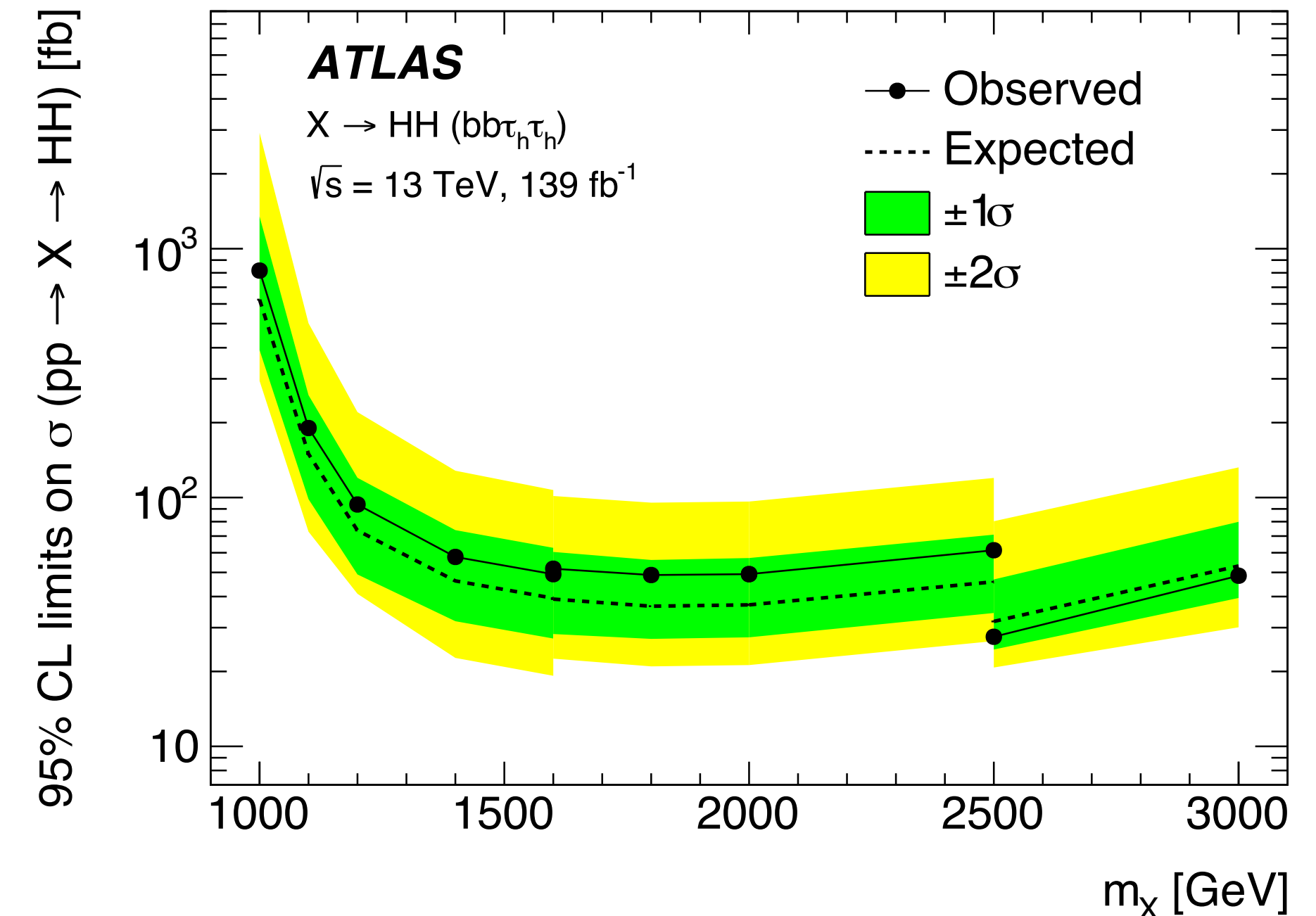
Tagging likely to benefit of more advanced constituent-based tagging techniques

Application example : $X \rightarrow HH \rightarrow bb\tau\tau$

- $H(bb)H(\tau\tau)$ events reconstructed with two large radius jets
 - mass compatible with 125 GeV, 2 subjects b-tagging
- Multijet background estimated from data, $Z \rightarrow \tau\tau$ from MC



*Very small number of events
 → simple counting experiment*



Limit discontinuities related to the change in the m_{HH}^{vis} requirement depending on the m_X hypothesis

Conclusions

- Very high $p_T(H)$ final states are interesting for HH physics
 - high-sensitivity phase space corner for SM ggF, anomalous κ_{2V} coupling, high mass resonances
- Reconstruction of $p_T(H) \gtrsim 250$ GeV decays done as a single large-radius jet ($R = 1$)
 - re-clustering of components to identify subjets and access jet substructure
- Improvement in the performance of the H(bb) identification obtained by moving from high-level (Xbb) to constituent-based (GN2X) taggers
 - 2.5x better multijet rejection for the same signal efficiency
 - transformer architecture well suited for identification tasks
- Boosted H($\tau\tau$) identification thus far only on fully hadronic final states, simpler BDT algorithm based on high-level features
 - expect a similar improvement as for H(bb) by exploiting constituent information
- Highly performant boosted H identification as key to push the exploration of the high m_{HH} regime