



# Reconstruction of top associated final states using the Matrix Element Method

G. Dissertori, A. Gomez, G. Kasieczka, **Maren Meinhard**, J. Pata,  
C.ReiBel, R. Wallny

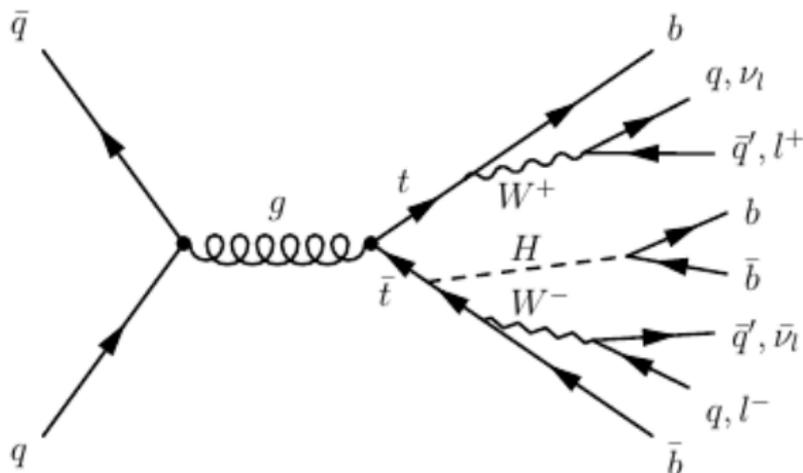
# Introduction

- Present methods used to identify top associated final states
- Focus on the matrix element method and substructure techniques
- As an example, use  $t\bar{t}H$ ,  $H \rightarrow b\bar{b}$  process
- Observation of  $t\bar{t}H$  earlier this year by ATLAS and CMS [1,2], with the Higgs decay to b quarks being a major contribution to the combination
- $t\bar{t}H$ ,  $H \rightarrow b\bar{b}$  channel gives direct access to the Yukawa coupling to the top and b quarks

[1] ATLAS Collaboration, Observation of Higgs boson production in association with a top quark pair at the LHC with the ATLAS detector, Phys. Lett. B 784, 173 (2018)

[2] CMS Collaboration, Observation of  $t\bar{t}H$  production, Phys. Rev. Lett. 120, 231801 (2018)

# Topology of $t\bar{t}H$ , $H \rightarrow b\bar{b}$ events



- Consider Higgs decay to  $b\bar{b}$
- Production of four  $b$  quarks, leptons and neutrinos or additional light quarks depending on the decay mode of the tops

## Identification of $t\bar{t}H$ , $H \rightarrow b\bar{b}$ events

- Complicated final state involving leptons, many jets and MET
  - $t\bar{t}H$  production cross-section is only 0.5 pb (Gluon fusion:  $\sim 44$  pb)
  - Main background (  $t\bar{t}+b\bar{b}$  ) cross-section is three orders of magnitude larger than the signal cross-section ( $\sim 832$  pb)
  - $t\bar{t}+b\bar{b}$  background is irreducible since the final state consists of the same particles than the signal
  - Large theory uncertainties in the multiscale QCD background modelling
- ⇒ Reconstruction of  $t\bar{t}H$ ,  $H \rightarrow b\bar{b}$  events is challenging  
Requires dedicated analysis techniques,  
such as the Matrix Element Method

## The Matrix Element Method (MEM)

Probability  $P(\mathbf{x}|\alpha)$  for an event  $\mathbf{x}$  to be the final state of process  $\alpha$ :

$$P(\mathbf{y}|\alpha) \propto \frac{1}{\sigma_\alpha} \int d\Phi(\mathbf{x}) |M_\alpha|^2(\mathbf{x}) W(\mathbf{x}, \mathbf{y})$$

where

- $\sigma_\alpha$  is the total cross section of process  $\alpha$
- $d\Phi(\mathbf{x})$  is the phase-space measure
- $|M_\alpha|^2(\mathbf{x})$  is the LO scattering amplitude squared
- $W(\mathbf{x}, \mathbf{y})$  is the transfer function (probability to obtain a detector response  $\mathbf{y}$  for a particle level event  $\mathbf{x}$ )

Signal ( $\mathbf{s}$ ) to background ( $\mathbf{b}$ ) discriminant:

$$P_{s/b} = \frac{P(\mathbf{y}|\mathbf{s})}{P(\mathbf{y}|\mathbf{s}) + \kappa \cdot P(\mathbf{y}|\mathbf{b})}$$

with  $\kappa$ : scale factor optimized to 0.1

# Transfer functions I

- MEM takes into account detector resolution by using transfer functions (TF) to relate observed quantities  $\mathbf{y}$  to parton-level quantities  $\mathbf{x}$
- Need TFs for all observed objects: jets, leptons and MET
  - Leptons: Assume perfect momentum resolution  
→ TF is a Dirac delta function
  - MET:

$$W_{\text{MET}}(\mathbf{p}_T | \sum_k \mathbf{p}_k) = \frac{1}{2\pi|\Sigma|^{1/2}} \exp \left[ -\frac{1}{2} (\mathbf{p}_T - \sum_k \mathbf{p}_k)^T \Sigma^{-1} (\mathbf{p}_T - \sum_k \mathbf{p}_k) \right]$$

with  $\Sigma = \sigma_{\text{MET}} \mathbf{I}$ ,  $\sigma_{\text{MET}} = 30 \text{ GeV}$  and  $\mathbf{I}$  the identity matrix

## Transfer functions II

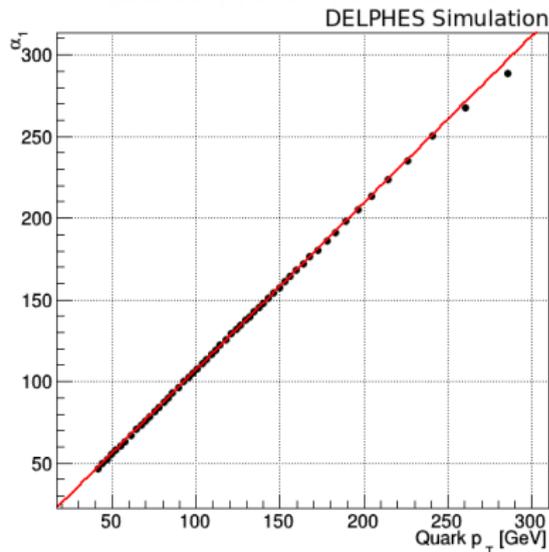
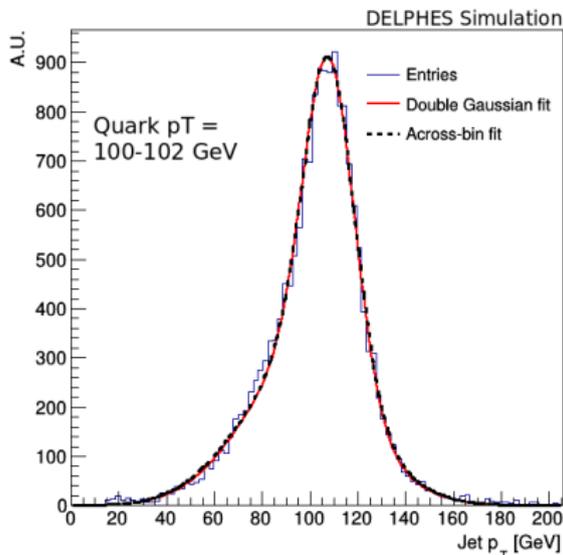
- Jets: Evaluate TFs on MC simulation depending on momentum and flavour of the quark
- Different transfer functions for b jets and light jets (including charm), and for  $|\eta| < 1$  and  $|\eta| > 1$
- TF evaluated separately for quarks of different  $p_T$  to account for improving momentum resolution at higher  $p_T$
- Double Gaussian fit performed in all bins in  $p_T$  :

$$TF(p_T | p_{T,gen}) = N \left[ 0.7 \exp \left( \frac{p_{T,gen} - p_T - \alpha_1}{\alpha_2} \right)^2 + 0.3 \exp \left( \frac{p_{T,gen} - p_T - \alpha_3}{\alpha_2 + \alpha_4} \right)^2 \right]$$

N: normalization factor

## Transfer functions III

- Perform a polynomial fit (across-bin fit) in  $p_T$  for all four fit parameters of the individual Double Gaussian fits ( $\alpha_i$  for  $i \in 1, \dots, 4$ )
- Use parameters of polynomial fit to reconstruct transfer functions for each jet depending on its  $p_T$ ,  $\eta$  and flavour



## MEM specifications

- Requires exactly four b tagged jets to be computed
- Consider 12 permutations to evaluate all possibilities to match b quarks to b tagged jets:

b quarks	Remaining nb. of b jets	Permutations
2 from Higgs decay	4	$\binom{4}{2} = 6$ permutations
1 from top decay	2	$\binom{2}{1} = 2$ permutations
1 from antitop decay	1	$\binom{1}{1} = 1$ permutations
		$\Rightarrow 12$ permutations

# MEM for over and partially reconstructed events

Expect  $N_{\text{quark}} = 4/6/8$  if two/one/zero top quarks decay leptonically

**Extra radiation from QCD ( $N_{\text{jets}} > N_{\text{quarks}}$ ):**

Set  $N_{\text{jets}} = N_{\text{quarks}}$ , and ignore remaining jet(s) for all possible permutations of jets. Sum over all combinations in the integration of the MEM

**Missing quarks in the reconstruction ( $N_{\text{jets}} < N_{\text{quarks}}$ ):**

Three possible reasons:

- 1 Jets out of acceptance
- 2 Jets below the energy threshold
- 3 Merged jets at high transverse momentum of top and / or Higgs

Solve 3 by combining MEM with substructure techniques (see later)

Solve 1,2 by integrating out the kinematics of the missed jets

## MEM for partially reconstructed events

Extend space of observables:

$$\mathbf{y} \rightarrow \mathbf{y}' = (\mathbf{y}, (E_q, \mathbf{e}_q)_{q \in \text{lost}})$$

and the MEM probability:

$$P(\mathbf{y}) \rightarrow P'(\mathbf{y}') = \frac{1}{\sigma'} \frac{d\sigma_i}{d\mathbf{y} \prod_{q \in \text{lost}} dE_q d\mathbf{e}_q}$$

Finally, integrate out unknown kinematics of lost quarks:

$$P(\mathbf{y}) = \int \left[ \prod_{q \in \text{lost}} dE_q d\mathbf{e}_q \right] P'(\mathbf{y}')$$

⇒ Add new integration variables, and extra combinations for identifying the quarks which failed reconstruction

- Longer computation time (more permutations to consider)
- Increases event selection for analysis

# Why MEM?

## Advantages:

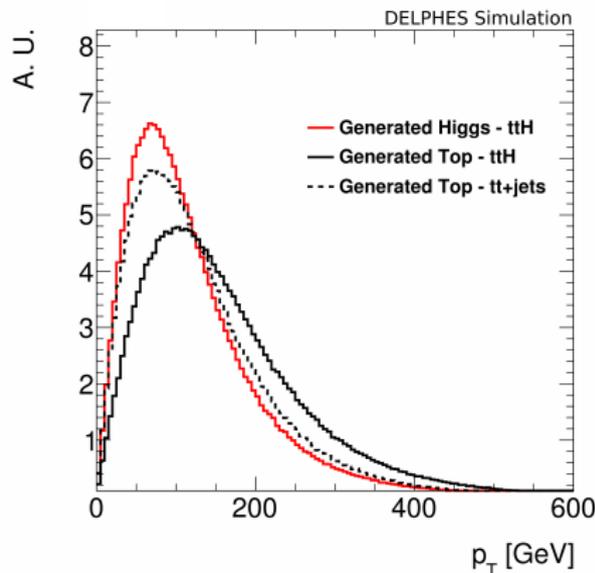
- Theoretically well motivated
- Performance compatible with most recent ML based techniques

## Disadvantages:

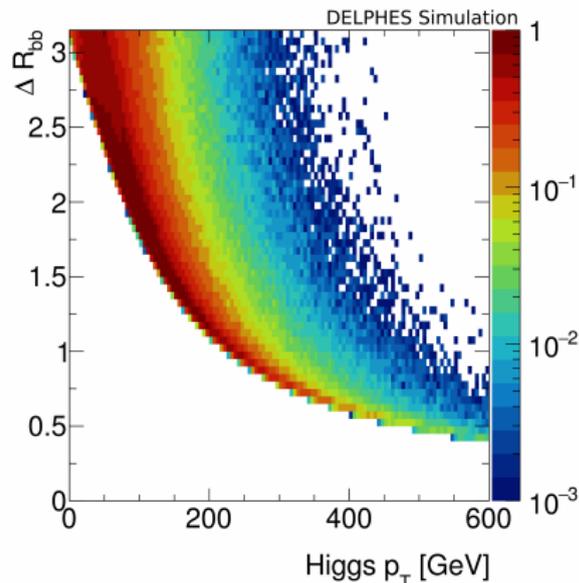
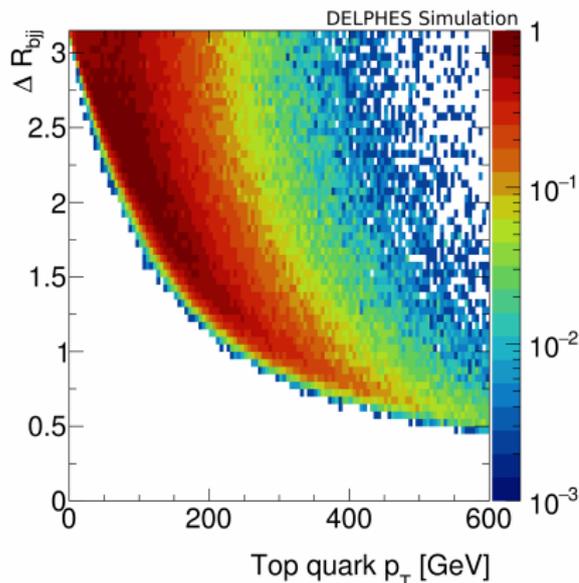
- Relies on precise evaluation of matrix element, which is a major source of uncertainty (ME only evaluated at LO)
- Computationally very expensive ( $\sim 1$  minute per event, not easily sustainable for HL-LHC)

# Substructure methods in $t\bar{t}H$ , $H \rightarrow b\bar{b}$ analysis

- Expect worse performance of the MEM at high  $p_T$  of the Top & Higgs, in particular because the hadronization of the quarks in which those particles decay is likely to be merged into a single jet  
 $\Rightarrow$  MEM cannot easily associate jets to generator level quarks
- Possibility to combine MEM with substructure methods to recover such events
- Focus mostly on top tagging here



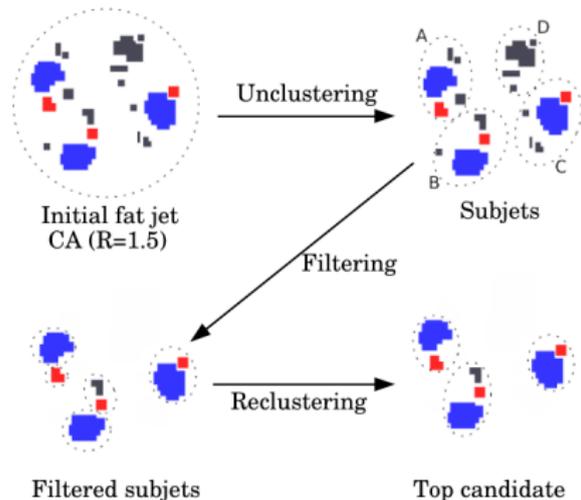
# Kinematics of $t\bar{t}H$ , $H \rightarrow b\bar{b}$ events



- $\Delta R_{bjj}$ : Approximate CA jet size containing the top's decay products
- $\Delta R$  decreases with increasing  $p_T$  as  $\Delta R \sim \frac{2 \cdot m}{p_T}$
- Sensitivity to top quarks with  $p_T > 200$  GeV with a cone size of 1.5
- Possibility to also use jet substructure for Higgs reconstruction

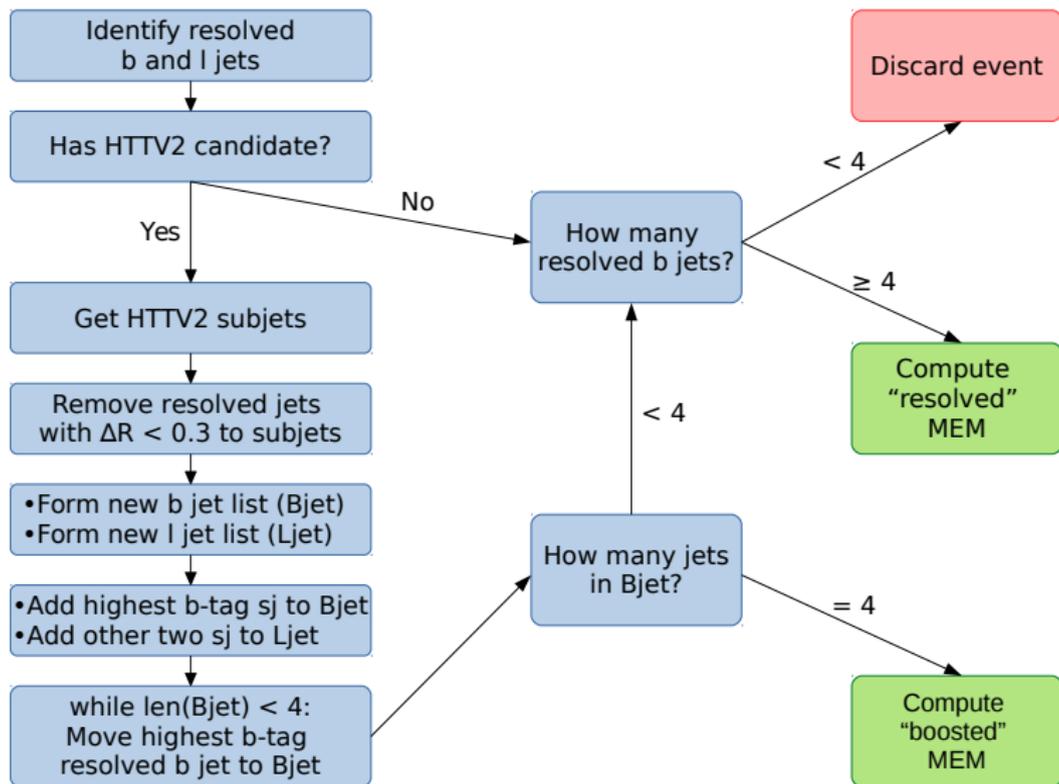
# Top candidate selection

Use HEPTopTagger V2 (HTTV2) algorithm for top identification [3]



- Uses Cambridge-Aachen jets with a cone size of 1.5
- Filtering applied to remove contributions from pile-up and from underlying events
- HTTV2 performance optimal for moderate boosts (starting from  $p_T$  200 GeV) of the top (which is the case in the  $t\bar{t}H$ ,  $H \rightarrow b\bar{b}$  analysis)
- Reconstructs exactly three subjects which are needed as an input to the MEM

# Combining substructure methods with the MEM



## Removing permutations

Number of permutations can be reduced when knowing from which particle a jet arises:

- Standard boosted: 12 permutations
- Boosted with HTTV2 candidate: 3 permutations

b quarks	Remaining nb. of b jets	Permutations
1 from HTTV2 candidate	4	known origin
2 from Higgs decay	3	$\binom{3}{2} = 3$ permutations
1 from top/antitop decay	1	$\binom{1}{1} = 1$ permutations
		$\Rightarrow 3$ permutations

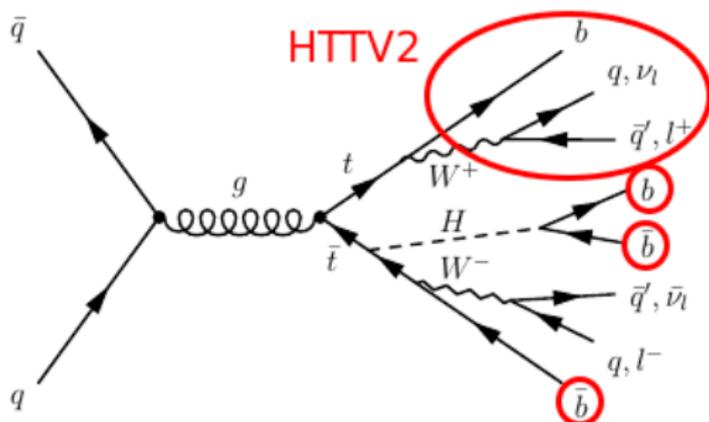
## Computation time per event

Category	Time ttH hypothesis [s]	Total time [s]
Standard resolved	$16.5 \pm 9.4$	$52.5 \pm 27.4$
Boosted	$4.1 \pm 0.5$	$13.7 \pm 1.4$
Fixed permutation with HTTV2	$1.1 \pm 0.1$	$3.5 \pm 0.3$

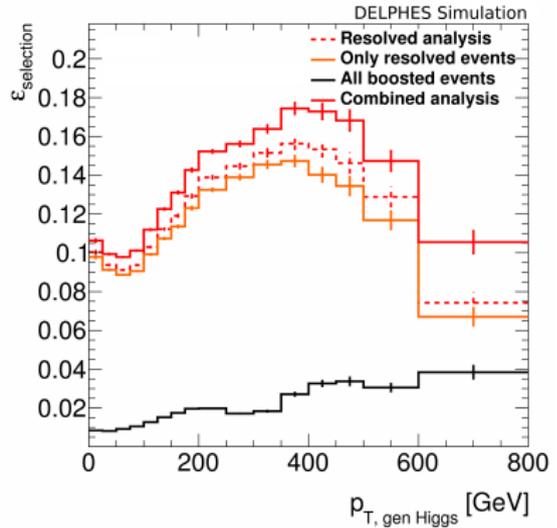
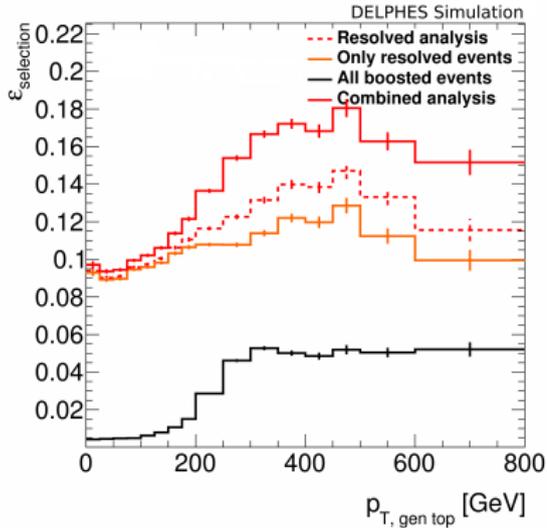
- Standard boosted analysis: Number of jets limited to 6 since QCD radiation jets can be identified and removed  
⇒ MEM computation time decrease by  $\sim 75\%$  when using HTTV2 subjects
- Further decrease of  $\sim 75\%$  when reducing number of permutations
- Large uncertainty on runtime due in particular to different quark kinematics, which have different transfer functions
- For Higgs tagging: 2 permutations left if only Higgs is tagged, 1 permutation if both Higgs and one hadronic top are tagged  
⇒ Expect reduction from  $\sim 1$  min to  $\sim 1$  s per event

# New boosted events I

- MEM needs four b tagged jets as input
- For boosted tops, likely miss the jet originating from the b quark into which the top decays
- Possibility to recover events with only 3 resolved b tagged jets if they have a HTTV2 candidate:



# New boosted events II



- Selection efficiency increases by  $\sim 30\%$  at  $p_{T, \text{Top}} > 200$  GeV
- Correlation between Higgs and top  $p_T$   
 $\Rightarrow$  analysis using boosted tops also targets high Higgs  $p_T$  events

# Sensitivity to BSM physics models

- Various BSM models predict deviations from the SM in  $t\bar{t}H$ ,  $H \rightarrow b\bar{b}$  events which appear in the boosted regime
- Some examples:
  - Deviations from the SM prediction in the CP structure of the Top-Higgs coupling [4]
  - Additional contributions to  $\mathcal{L}_{SM}$  such as the dimension-6 chromatic dipole and Higgs-gluon kinetic coupling which modify the SM Higgs momentum distribution [5]

[4] M. Buckley & D. Gonçalves, Boosting the Direct CP Measurement of the Higgs-Top Coupling, Phys. Rev. Lett. 116, 091801 (2016)

[5] J. Bramante *et. al.*, Cornering a Hyper Higgs: Angular Kinematics for Boosted Higgs Bosons with Top Pairs, Phys. Rev. D 89, 093006 (2014)

# Conclusion

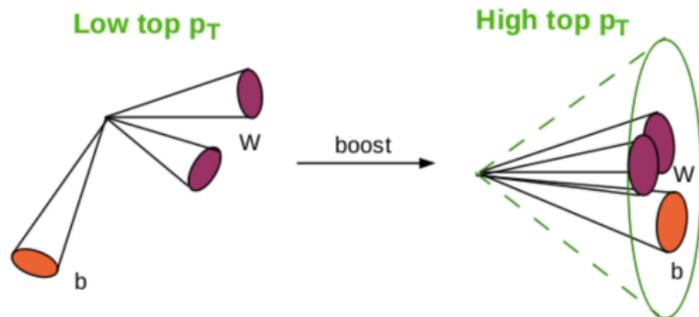
- Presented implementation of the Matrix Element Method for the analysis of the  $t\bar{t}H$ ,  $H \rightarrow b\bar{b}$  process
- Combining MEM with substructure techniques:
  - Reduce MEM computation time by 90%
  - Improve analysis performance by increasing event selection efficiency

## Backup

## Sample specifications

- NLO event generator POWHEG (v.2) used for simulation of signal and background
- Pythia 8.200 used for simulation of parton shower and hadronisation
- Higgs boson mass is assumed to be 125 GeV
- Top quark mass value is set to 172.5 GeV
- Assume pile-up of 30 (same conditions than in 2017 LHC run)

# Substructure methods



- Decay products of boosted objects such as top quarks are more collimated at high  $p_T$
- Contained in a large radius jet for hadronic decays

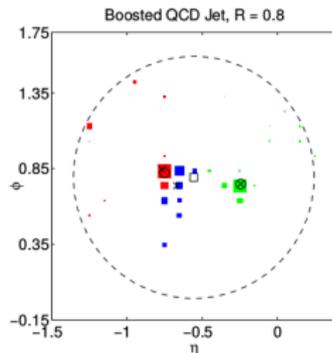
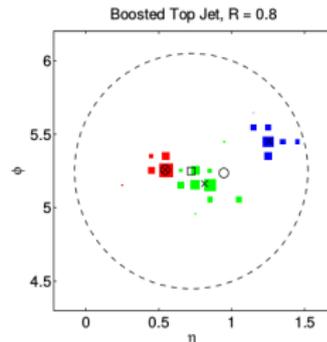
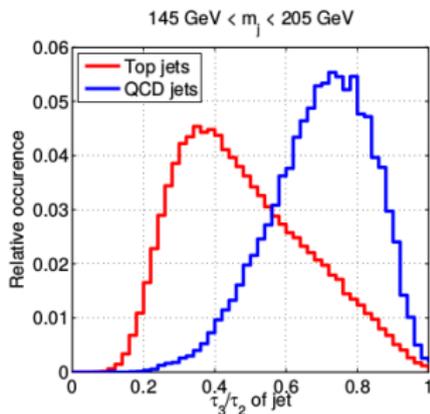
## Selection criteria on HTTV2 candidates

- $p_T > 200$  GeV
- $|\eta| < 2.4$
- $\Delta R$  (lepton, HTTV2 candidate)  $> 1.5$
- Mass:  $160 \text{ GeV} < m < 380 \text{ GeV}$
- N-subjettiness:  $\tau_{32SD} < 0.8$  (evaluated from softdrop fatjet ( $z_{\text{cut}} = 0.1, \beta = 0$ ) associated to HTTV2 candidate)
- W mass compatibility:  $f_{\text{rec}} < 0.65$

# N-subjettiness [6]

$$\tau_N = \frac{1}{d_0} \sum_k p_{T,k} \min\{\Delta R_{1,k}, \Delta R_{2,k}, \dots, \Delta R_{N,k}\}$$

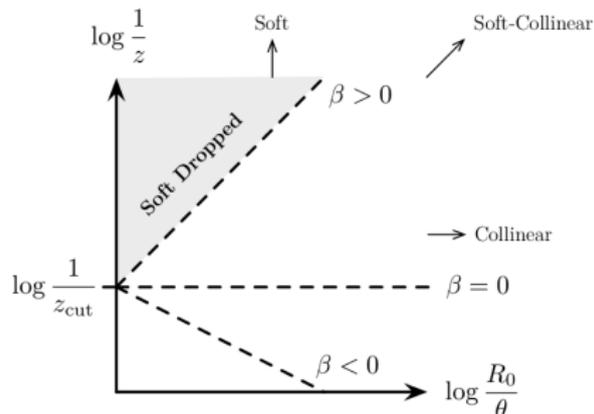
- Small  $\tau_i$  if jet compatible with i-prong substructure
- Top tagging: use ratio  $\frac{\tau_3}{\tau_2}$



# Soft Drop [7]

- Remove low  $p_T$  wide-angle constituents
- Find hard substructure using step-wise unclustering
- Remove jet constituent if:

$$\frac{\min(p_{T1}, p_{T2})}{p_{T1} + p_{T2}} < z_{\text{cut}} \left( \frac{\Delta R_{12}}{R_0} \right)^\beta$$



[7] A. Larkoski et. al., Soft Drop, JHEP 1405, 146 (2014)