



Reconstruction of top associated final states using the Matrix Element Method

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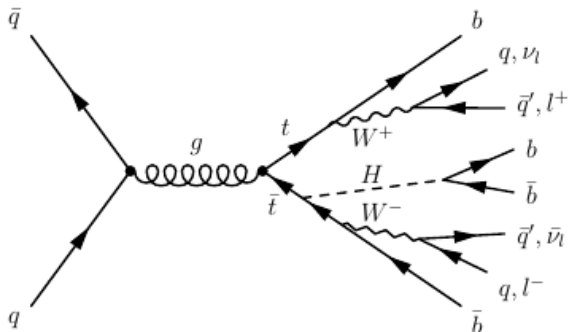
Introduction

- 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: ~ 44 pb)
 - Main background ($t\bar{t}+b\bar{b}$) cross-section is three orders of magnitude larger than the signal cross-section (~ 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 α :

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

where

- σ_α is the total cross section of process α
- $d\Phi(\mathbf{x})$ 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 κ : 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 $\Sigma = \sigma_{\text{MET}} \mathbf{I}$, $\sigma_{\text{MET}} = 30$ GeV and \mathbf{I} the identity matrix

Transfer functions II

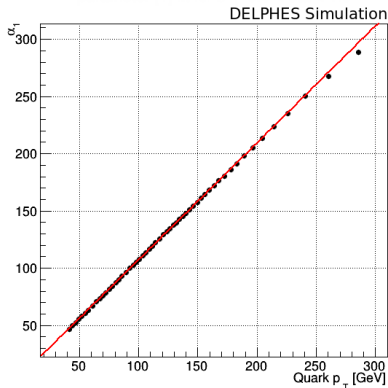
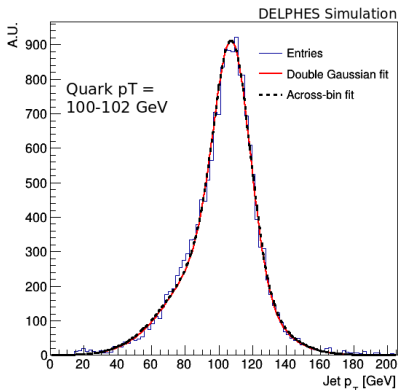
- Jets: Evaluate TFs on MC simulation depending on momentum and flavour of the quark
- Different transfer functions for b jets and light jets (including charm), and for $|\eta| < 1$ and $|\eta| > 1$
- TF evaluated separately for quarks of different p_T to account for improving momentum resolution at 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 (α_i for $i \in 1, \dots, 4$)
- Use parameters of polynomial fit to reconstruct transfer functions for each jet depending on its p_T , η 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:

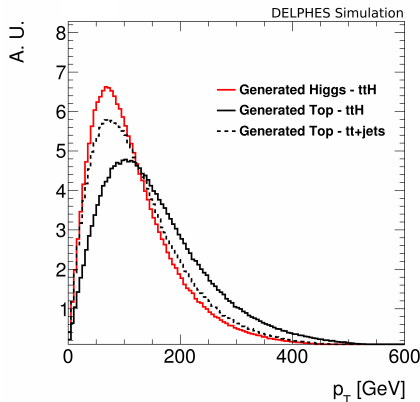
- Theoretically well motivated
- Performance compatible with most recent ML based techniques

Disadvantages:

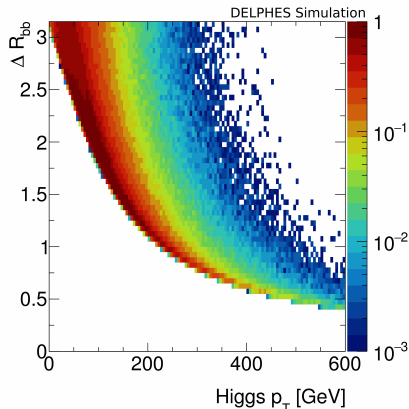
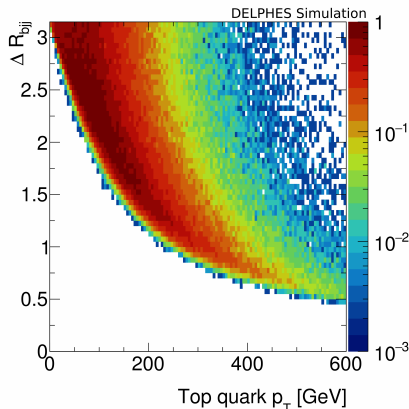
- Relies on precise evaluation of matrix element, which is a major source of uncertainty (ME only evaluated at LO)
- Computationally very expensive (~ 1 minute per event, not easily sustainable for HL-LHC)

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



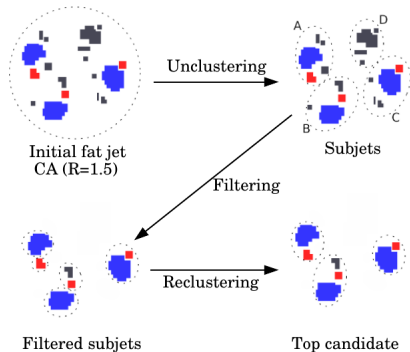
Kinematics of $t\bar{t}H$, $H \rightarrow b\bar{b}$ events



- ΔR_{bjj} : Approximate CA jet size containing the top's decay products
- ΔR 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

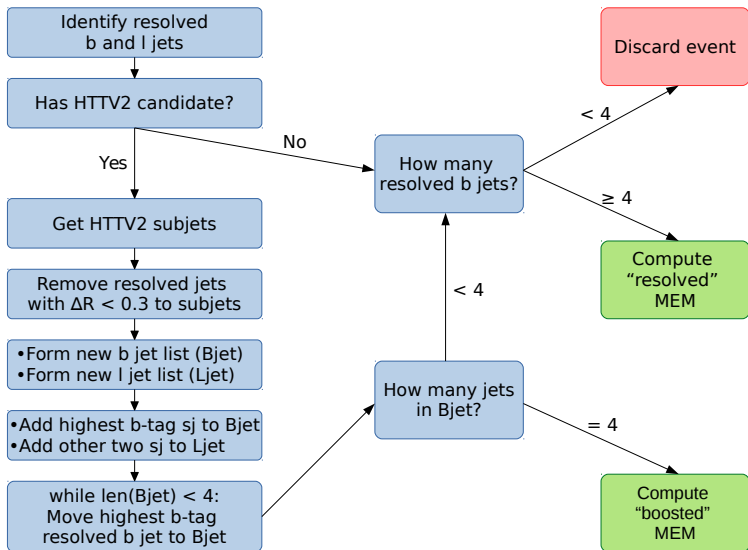
Top candidate selection

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

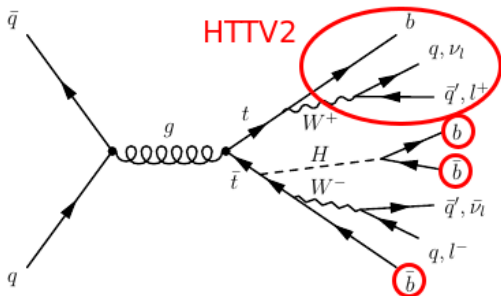
Computation time per event

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

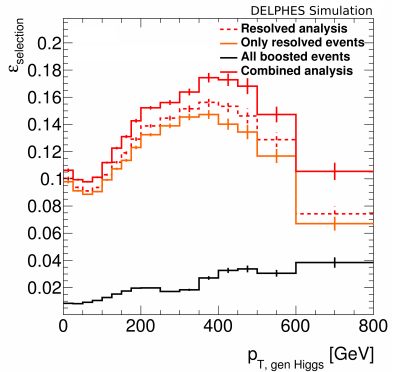
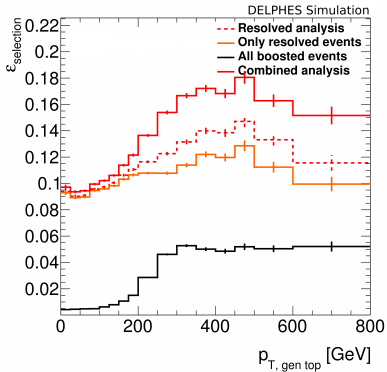
- Standard boosted analysis: Number of jets limited to 6 since QCD radiation jets can be identified and removed
 ⇒ MEM computation time decrease by $\sim 75\%$ when using HTTV2 subsets
- Further decrease of $\sim 75\%$ when reducing number of permutations
- Large uncertainty on runtime due in particular 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 ~ 1 min to ~ 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

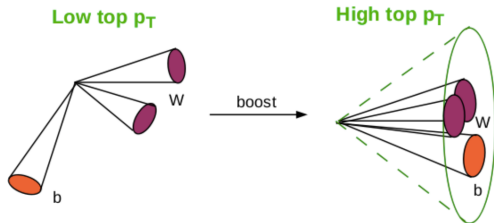
- Presented implementation of the Matrix Element Method for the analysis of the $t\bar{t}H$, $H \rightarrow b\bar{b}$ process
- Combining MEM with substructure techniques:
 - Reduce MEM computation time by 90%
 - Improve analysis performance by increasing event selection efficiency

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

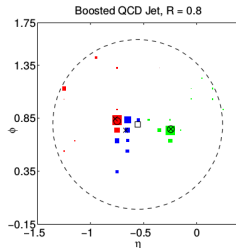
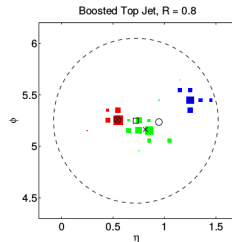
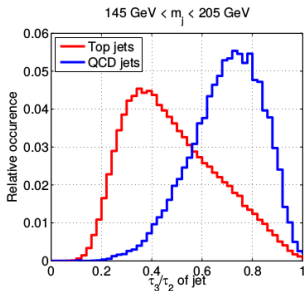
Selection criteria on HTTV2 candidates

- $p_T > 200$ GeV
- $|\eta| < 2.4$
- ΔR (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]

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

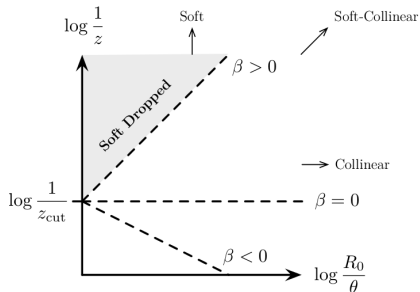
- Small τ_i if jet compatible with i-prong substructure
- Top tagging: use ratio $\frac{\tau_3}{\tau_2}$



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)