



# Heavy-Flavour Lagging in CMS Run 2

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### Outline of the talk

 Jet flavour identification and the corresponding calibration of the simulated response to data are a crucial feature for Higgs, SM and BSM physics at the LHC

- b-quarks present in the top-quark decay
- largest Higgs decay branching ratio in  $H \rightarrow bb$
- General introduction on CMS heavy flavour tagging
- Algorithm performance and results for resolved and boosted jets
- Highlights on flavour tagging applications to CMS physics measurements and for CMS upgrade projects
- Calibration of b-tagging response from simulation to data discussion of calibration techniques for b-jets, c-jets and light-flavour mistag rate measurement
  - Wrapping-up and conclusions

Unless otherwise specified, all results presented in this talk are published in <u>CMS-</u> <u>BTV-16-002</u>

A CMS collision events with 3 jets, and a multitude of tracks, reconstructed primary and secondary vertices



## Heavy flavour tagging

- b-jets stem from the process of hadronisation of b-quarks B-hadron properties used to identify b-jets
- Iarge mass, few GeV
- long lifetime,  $\beta \gamma c \tau$ , order of mm
  - displaced tracks and secondary vertices
- Iarge momentum (around 70%) carried by B-hadrons
- ▶ presence of direct and indirect semileptonic decays, i.e.  $b \rightarrow \mu \nu X$  (BR  $\sim 12\%$ ),  $b \rightarrow c \rightarrow \mu \nu X$  (BR  $\sim 10\%$ )

Inputs from low-level taggers exploiting features of the b-jet decay topology

- impact-parameter of tracks associated to jets, presence of secondary vertices
- combination of high-level observables and low-level properties (from particle-flow candidates) included in DNN
- strong push for development of Deep Neural-Network based techniques for CMS b-tagging LHC Run 2 legacy results





#### Tagger algorithms for resolved jets

Input variables discriminating between light-flavour-jets, c-jets and b-jets

- track impact parameters, SV features (mass, flight-distance),...
- Deep Neural Network algorithm (DeepCSV) trained on multi jet and top quark pair events making use of high-level features and providing b vs light-flavour and b vs c-jet separation
  - c-tagging is an additional challenge given the c-jet properties
    - c-discrimination made possible due to the multi class output structure of DeepCSV → CvsL and CvsB discrimination





DNN

architecture

for DeepCSV

and DeepJet



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Tagger algorithms for resolved jets - improving architectures

- Strong push to further improve b-tagging performance by exploiting more performant taggers for Run 2 legacy results
- DeepJet being developed as a successor of DeepCSV
  - inclusion of low-level input features from particle-flow candidates (properties of charged and neutral particles and secondary vertices)
  - significant performance gain over DeepCSV coming from usage of larger set of low-level inputs, less restrictive track selection and a suitable (more complex) NN architecture



# Tagger algorithms for boosted jets Several physics measurements explore high pt regime to mitigate overwhelming QCD background

- collimated b-jets reconstructed as AK8 jets significant improvement in sensitivity results due to boosted taggers - extensively used in several CMS measurements
- Two main algorithms developed by CMS for boosted regime:



- DeepDoubleB and DeepAK8 dedicated DNN trainings using boosted features providing distinct probabilities for bbVs light-flavour, top, QCD
- large gain wrt previous algorithms (DoubleB) based on BDT training successful mass decorrelation to avoid background sculpting, either via the loss function (DeepDoubleB) or by using adversarial training (DeepAK8)





# Highlights on b-tagging in physics and upgrades

Several CMS physics analyses and upgrade projects benefit from improved b-tagging performance

Flavour tagging for resolved and boosted topologies plays a fundamental role in the observation of the Higgs boson decay to bottom quarks <u>PRL 121</u>, <u>121801</u> and in the inclusive high pt ggH $\rightarrow$ bb search <u>CMS-</u> <u>HIG-19-003</u>

CMS Run 2 results





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CMS Upgrade for HL-LHC

Adding timing information for CMS MIP Timing Detector improves b-tagging characterisation and increases overall performance by allowing to recover performance in high pile-up regime

- timing information used for track selection
- additional results available <u>CMS-TDR-020</u>



#### Calibration on data - overview of scale factor methods.

- Calibration techniques derive correction factors to ensure the performance (efficiency) of heavy-flavour tagging in simulation is the same as in data
  - Several topologies selected for extraction of scale factors enriched in b-jets, c-jets, light-flavour jets
    - <u>b-jet calibration</u>: ttbar, μ-enriched, <u>c-jet calibration</u>: W+c, light-flavour jet calibration: QCD multijet
    - majority of calibration methods calculate SF for a fixed cut on the discriminator values, full b-tagging discriminant shape correction also available for DeepCSV and DeepJet algorithms

Full set of calibration methods to ensure redundancy and usage of orthogonal phase-spaces ( $\mu$ -enriched, ttbar, ..)  $\rightarrow$  exploit combination of results as input to physics measurements



Examples of combination for b-jet calibrations to probe consistency of SF results

## AK4 - Calibration for b-jets

- Usage of discriminating observables based on event topology to mitigate presence of light-flavour jet polluting the phase space for the efficiency measurements on b-jets
- tt-based calibrations:
  - Tag&Probe (semileptonic tt): probe-jet to determine efficiency of b-jets in data and simulation
  - Kinematic fit (dileptonic tt): usage of BDT with kinematic variables to discriminate jets in the tt system from ISR/FSR jets
  - <u>µ-enriched calibrations</u>:
    - ptRel, System8, LT methods using semileptonic b-decays momentum of the muon wrt jet axis larger for b-jets and powerful for b-jet discrimination - usage of ptRel templates from simulation





#### AK4 - Calibration for c-jets

 W+c topology - W+c production mainly due to processes in which W and c are opposite sign, dominant background (W+qq) balanced OS/SS rate

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- OS/SS subtraction provides large enrichment in W+c with a signal purity of around 60%(80%) for W→ev (µv)
- efficiency measurements in data and in simulation as a function of jet pt used to extract SF's for different working points
- Additional method making use of c-jets from ttbar semileptonic events using a kinematic reconstruction to target c-jets stemming from the W decay  $d, \bar{d}$



### AK4 - Calibration for light-flavour jets

- Inclusive multi-jet events default tagger but use only negative impact parameter values and SV's with negative flight distance
- Distribution should be approximately symmetric for lightflavour jets - non-zero values of IP/SV flight distance coming from resolution effects



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# Wrapping-up & conclusions

<sup>r</sup> Heavy flavour tagging is a crucial ingredient for measurements and searches at the LHC

- Presented overview of algorithm developments in CMS for b/c-jet identification for resolved and boosted topologies
  - several new algorithms developed for CMS Run 2 legacy measurements based on better understanding of deep learning techniques and jet topology features
  - ► excellent level of background discrimination has definitely paid off very useful for searches and measurements with b/c-jets in the final state and for CMS flagship analyses such as VH→bb observation with 2016+2017 data, first VH→cc search with 2016 data, inclusive boosted search in bb final state
  - significant work on the upgrade side has also allowed to achieve excellent performance by making use of novel detector features embedded in the b-tagging chain (e.g. timing information in MTD)
- Calibration of b/c-tagging algorithms and light-flavour mistag rate measurements are also an essential features of heavy flavour tagging
  - calibration analyses for b-, c-jet and light-flavour measurements are complex and have largely benefitted from combination of results expected from several methods targeting different phasespaces

# Additional slides

2D c-tagger working points & algorithm definitions 14



![](_page_13_Figure_2.jpeg)