Workshop on Heavy flavor tagging in heavy ion collisions - CTU Prague 2019/3/15

# ALICE b-jet tagging in Run2 5 TeV pPb collisions with the SV method



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#### goals and datasets

#### **pp**:

- pQCD benchmark and baseline for nuclear modification
- Color charge vs. mass/flavor effects?
- **p-A**:
  - CNM effects?
     Baseline for modification in hot medium
- A-A:
  - mass ordering?
  - Low/intermediate pT <u>unique</u>
  - contribution of gluon-splitting to direct b quark production?
  - Radiative or collisional energy loss?
- Experimental data:
  - pp 2017 data at 5 TeV (IP method) ~600M evts
  - p-Pb 2016 data at 5 TeV (IP and SV methods) ~900M Minimum Bias evts
  - ITS+TPC tracks, p<sub>T</sub>>0.15
  - Anti-kT jets, R=0.4, |η|<0.5</li>



## extracting the b-jet cross section

- A. Jet Reconstruction
- B. b-jet selection
  - **b-jet**: presence of a b-hadron inside a cone with given R centered on the jet axis
  - 1. Impact parameter significance method based on the closest approach to the primary vertex of tracks inside a jet Hadi Hassan (Linus Feldkamp, Min Jung Kweon, Minjung Kim)
  - 2. Displaced secondary vertex method secondary vertex reconstruction and evaluation of its distance from the primary vertex - Ashik Ikbal Sheikh, Filip Křížek, Artem Isakov, R.V. (Elena Bruna, Lukás Kramárik, Gyulnara Eyyubova)
- C. Statistically remove non-b jets from tagged sample
- D. Unfolding
- E. Efficiency correction



Displaced Tracks

Secondary

Verte

do

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### Jet Vertex Jet Vertex Jet

#### 5

### spectrum extraction

#### Extract SV tagging efficiency from Monte Carlo

$$\epsilon_{b,c,udsg}(p_{\mathrm{T,ch.\ jet}}^{det.}) = \frac{N_{b,c,udsg}^{tagged}(p_{\mathrm{T,ch.\ jet}}^{det.})}{N_{b,c,udsg}^{gen}(p_{\mathrm{T,ch.\ jet}}^{det.})}$$

Extract **purity** from template fit and MC

$$P(p_{\mathrm{T,ch. jet}}^{det.}) = \frac{N_{\mathrm{b-jets}}(p_{\mathrm{T,ch. jet}}^{det.}, \mathrm{jet})}{N_{\mathrm{all jets}}(p_{\mathrm{T,ch. jet}}^{det.}, \mathrm{jet})}$$

# nd MC is essential!

==> Reliable MC

Correct tagged inclusive raw spectrum:

$$\frac{1}{N}\frac{dN_{\text{measured,b}}}{dp_{\text{T}}} = \frac{1}{N}\frac{1}{\epsilon_{b}} \cdot P \cdot \frac{dN_{\text{tagged}}}{dp_{\text{T}}}$$

• Unfolding and final correction step  $p_{T,ch.}^{det.}$  jet  $\rightarrow p_{T,ch.}$  jet  $\frac{d\sigma_{b-jet}}{dp_T} = \frac{1}{L_{int}} \cdot \text{Unfolded}\left(\frac{dN_{\text{measured,b}}}{dp_T}\right)$ 

# analysis

- Data extraction (Run2 p-Pb, LHC16{q,t}):
- Efficiency and purity corrections
  - Efficiency: LHC17h6{a,b,c,d,e,f}2
  - Purity #1 "POWbc": real inclusive jets and POWHEG c,b spectra
  - Purity #2: "data-driven": template fits from LHC17h6\_2 simulations
     => a combined "hybrid" method
- Unfolding (SVD & Bayesian, binned)
  - Matrix based on LHC17h6\_2, outliers removed (p<sub>T</sub><p<sub>T</sub>hard x4)
  - PYTHIA hard processes + EPOS underlying event
- Systematics
  - Tracking & jet reconstruction related
  - b-tagging related

## tagging efficiencies vs. $p_T$



- Tagging cuts
  - Dispersion of reconstructed secondary vertex σ<sub>vtx</sub>
  - Significance of primary-secondary vertex distance  $SL_{xy} = L_{xy}/\sigma_{Lxy}$

## tagging performance



- Evolutions of efficiencies and mistagging rates with SL<sub>xy</sub>
  - Left: efficiency vs. SLxy, no sigvtx cut applied
  - Right: efficiency vs. mistagging rates for different SLxy values

## purity & tagging correction, POWHEG



#### Purity obtained as:

- Going to detector level: POWHEG spectrum \* detector matrix
- Using the good old formulae

$$f_{b}(p_{T}^{det}) = \frac{N_{b}^{tagged}(p_{T}^{det})}{N_{inclusive}^{tagged}(p_{T}^{det})}$$

$$N_{b}^{tagged}(p_{T}^{det}) = N_{inclusive}^{tagged}(p_{T}^{det}) - N_{b}^{Powheg}(p_{T}^{det}) \cdot \varepsilon_{b}(p_{T}^{det}) - N_{c}^{Powheg}(p_{T}^{det}) \cdot \varepsilon_{c}(p_{T}^{det}) \\ - \left(N_{inclusive}(p_{T}^{det}) - N_{c}^{Powheg}(p_{T}^{det}) - N_{b}^{Powheg}(p_{T}^{det})\right) \cdot \varepsilon_{lf}(p_{T}^{det})$$

#### uncertainty in POWHEG



Several variations (defaults in bold) and cross-variations:

- m<sub>b</sub>=4.5, 4.75, 5.0 GeV; m<sub>c</sub>=1.3, 1.5, 1.7 GeV
- factorization scale = 0.5, 1.0, 2.0; renormalization scale = 0.5, 1.0, 2.0
- Translates to a factor ~2 uncertainty on the corrected spectrum (later)
- See more: backup slides and <u>https://twiki.cern.ch/twiki/pub/ALICE/BtagSecVtx/PowhegSystematicsBeauty\_ashik.pdf</u>

#### purity, data-driven - template fits

Example: Minuit, lowest pT bin Example: RooFit, higher pT bin Probabilty density (GeV/c<sup>2)<sup>-</sup></sup> Number of jets < 20 GeV/c,  $L_{xy}/\sigma_{Lxy}$ 40<p\_\_\_\_<50 GeV/c  $>7, \sigma_{sv} < 0.03 \text{ cm}$ ALICE simulation  $|\eta_{iet}| < 0.5, N_{reco vtx} > 0$ PYTHIA + EPOS, p–Pb  $\sqrt{s_{NN}}$  = 5.02 TeV  $L_{xy}/\sigma_{Lxy} > 7, \sigma_{vtx} < 0.03$ Anti- $k_{\rm T}$  track jets with R = 0.4,  $|\eta_{\rm int}| < 0.5$ - data, all jets LF-jet 0.107 ± 0.14 c-jet 0.384 ± 0.11 b-jet 0.509 ± 0.14  $0^{-2}$ Raw data from MC  $10^{-3}$ LF jets: 0.19 ± 0.04 c jets: 0.48 ± 0.03 b jets: 0.33 ± 0.02 Raw data / Fit  $10^{-1}$ 2 0 3 3.5 0.5 2.5 4.5 Invariant mass of secondary vertex (GeV/ $c^2$ ) SV Mass [GeV]

#### Minuit vs. RooFit on measured data

- RooFit: template errors ignored can be a problem
- <u>Minuit</u>: correct treatment of errors;

$$F(n) = \sum_{i=1}^{nbins} \frac{(Data_i - B_i * p_B - C_i * p_C - LF_i * p_{LF})^2}{\sigma_{Data_i}^2 + (\sigma_{B_i} * p_B)^2 + (\sigma_{C_i} * p_C)^2 + (\sigma_{LF_i} * p_{LF})^2}$$

*but:* convergence problems at higher  $p_T$ 

## purity, data-driven - p<sub>T</sub>-dependence



- Minuit convergence problems already from 30 GeV/c in some cases, above 40 in most cases
  - Note: merging the bins did not help
- RooFit different at low- $p_T$  (and we trust it less than Minuit)
- But: At higher p<sub>T</sub>-bins, RooFit and Minuit always match
  - Perhaps less effect of template errors because of wider distributions

### purity - comparison of methods



Good news: very good consistency with the POWbc method

- POWbc and data-driven MC template closure: good match
- POWbc and data-driven with real data consistent within errors
- Strategy: data-driven constraints to be used to constrain purities from POWHEG

#### purity comparison examples



- Default POWHEG describes data regardless of tagging cut
- Scale variations cause big differences



## hybrid method: statistical exclusion



#### For each POWHEG setting:

- Compute χ<sup>2</sup> for each tagging cut
- sum them up
- Divide by sum of N<sub>points</sub>
- Keep statistically acceptable settings only (χ<sup>2</sup>/N<10)</li>
  - c fac=1 c ren=1 b fac=0.5 b ren=2
  - c fac=1 c ren=1 b fac=1 b ren=2
  - c fac=2 c ren=2 b fac=2 b ren=2



chi2/N values of the simultaneous test



# unfolding - SVD

- Generally good
  - Folded/raw ~1
  - Uncertainties below fluctuations
  - Convergent iteration (unfolded/prior)
  - kSVD>=4
- Some oscillation
  - ~2σ; plan to take care by rebinning or cropping the response matrix



## unfolding - bayesian

- Generally good
  - Folded/raw ~1
  - Uncertainties below fluctuations
  - Convergent iteration
  - kBayes>=4
- Some oscillation
  - ~2σ; plan to take care by rebinning or cropping the response matrix



0 0

40

60

80

#### spectrum with systematics



100

120

140

P<sub>T</sub><sup>jet</sup>

- Corrections with the Hybrid method
- Principal analysis: SL<sub>xy</sub>>7, σ<sub>vtx</sub><0.03
- Dominant uncertainties:
  - hybrid purity
  - unfolding (including method, regularization and prior)
  - tracking
  - tagging
- Consistent with
   POWHEG within errors

#### spectrum with systematics



- Corrections with the Hybrid method
- Principal analysis: SL<sub>xy</sub>>7, σ<sub>vtx</sub><0.03
- Dominant uncertainties:
  - hybrid purity
  - unfolding (including method, regularization and prior)
  - tracking
  - tagging
- Consistent with POWHEG within errors
  - Range: 10-100 GeV/c

#### some systematics (visualization)

Ratios of systematic variations compared to principal analysis



### Status Summary

We computed the 5 TeV pPb b-jet spectrum

- New hybrid purities and efficiencies
- Corrections are consistent
- Most of the systematics are at hand
- Detector matrix from EPOS+PYTHIA the extent of background effect low p<sub>T</sub> needs to be addressed
- New unfolding method, slight oscillations crop matrix?
- Some minor (?) systematics needed:
  - unfolding: test with different binning
  - contamination of primary tracks by secondary tracks
  - track p<sub>T</sub> smearing
- Next step: Preliminary for SQM

## extracting the b-jet cross section



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- C. Statistically remove non-b jets from tagged sample
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#### Impact parameter significance method

secondary production point

- Discriminator:  $sd_{xy} = \delta d_{xy}$ , where  $\delta$  is the impact parameter sign:  $sign(\vec{d_{xy}}, \vec{p_{iet}}).$ axis perpendicula o the iet axis
- Track counting Based on #tracks fulfilling threshold
  - N=1 : high-efficiency ; N=2 ; N=3 : high purity
- Efficiency/purity curves:





## Production of b-jets (pp and pPb)



- Production is consistent within N=1, 2 (shown), 3
- Constistent with POWHEG w/ scale variation
- b-jet fraction drops at low-p<sub>T</sub> in pPb

## R<sub>pPb</sub> of b-jets



- The R<sub>pPb</sub> of b-jets is consistent with unity
- …consistent with CMS measurements
- ...and with theory predictions within uncertainties
- The interaction of the b-jet with the cold nuclear matter has no effect on the b-jet within uncertainties.

### Systematics and ToDo

Uncertainty source		p <sub>T</sub> bins	
		10-20	20-30
collisions	Unfolding algorithm	3.14%	
	Regularization parameter	2.03 %	
	Prior	2.09%	2.91%
	Unfolding range	1.40%	1.43%
	δρτ	0.12%	0.29%
p-Pb	Tracking Efficiency	7.67%	10.60%
	Tagger working point	0.31%	0.24%
	V <sup>0</sup> rejection	0.20%	0.05%
	Normalization uncertainty	3.24%	
	Total	9.47%	11.7%
pp collisions	Unfolding algorithm	3.23%	
	Regularization parameter	3.3%	
	Prior	1.19%	0.19%
	Unfolding range	0%	
	Tracking Efficiency	9.3%	10.6%
	Tagger working point	0.13%	0.36%
	Normalization uncertainty	2.29%	
	Total	10.7%	11.7%

#### ToDo (Hadi)

- Change the jet probability distribution, and use another discriminator for the templates used in the tagging efficiency determination.
- Use another distribution to fit the purity.
- Cancel the correlated uncertainties on the b-jet fraction and the R<sub>pPb</sub>

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15 March 1848 Hungarian Revolution against the Habsburg rule

> Hungarian Academy of Sciences Founded 1830 count István Széchenyi

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## **POWHEG** simulations



Changes in "new" since the "old" one:

- acceptance |eta|<0.5 instead of |eta|<0.6 scaled by 1/1.2</p>
- more suitable 1-GeV/c binning
- Lorentz-boost applied
- p-Pb nPDF applied
- No significant difference between "old" and "new"
- Marginal match to FONLL

#### **POWHEG** systematics



#### Data-driven fits to real data



## Unfolding closure test - inclusive



### Jet probability algorithm



#### Efficiencies



Data-driven efficiency underestimated my MC!





## b-jet purity



b-jet tagging purity is consistent between data and MC.

## Underlying event

- UE density: ρ = median(<sup>p<sub>T,i</sub>/A<sub>i</sub>).C, where C = <u>CoveredArea</u>/TotalArea.

   Correct the jet p<sub>T</sub>:
  </sup>
  - $p_{T,j}^{Sub} = p_{T,j} \rho A_j.$





- UE fluctuation for unfolding
  - Random cone method

$$\delta p_T = p_T^{RC} - \rho \pi R^2$$

 If overlap with signal jet, throw again

# Unfolding

- Correction for detector effects.
   ⇒ Detector response (DR) matrix is needed.
- The DR is built by matching jets at the detector level to jet in the generated level:  $\Delta R_{jet1, jet2} =$

$$\sqrt{(\eta_{jet1} - \eta_{jet2})^2 + (\phi_{jet1} + \phi_{jet2})^2} < 0.25$$

Correction for UE fluctuations (for p–Pb collisions).

 $\Rightarrow$  background fluctuation (F) matrix need,

- The F matrix built from the  $\delta p_T$  distribution.
- The SVD unfolding was used (A. Hoecker et al).
- Prior: PYTHIA b-jet spectrum (jet-jet MC).
  - Combine both matrices for p-Pb :  $R = F \times DR$ .

p-Pb @ √s<sub>NN</sub> = 5.02 TeV

PT, jet (GeV/c)

- Closure test shows that the measured spectrum is correctly unfolded
- Correct for kinematic efficiency:
   fraction of remaining jets after rebinning.





#### Production cross-section (pp and pPb)



- Production is consistent within N=1,2,3
- Constistent with POWHEG w/ scale variation

## b-jet fraction (pp and pPb)



Production is consistent within N=1,2,3 and POWHEG

# R<sub>pPb</sub> of b-jets

N=2

N=1



- The R<sub>pPb</sub> of b-jets for N=1,2,3 is...
  - consistent with unity
  - and with theory predictions within uncertainties
- The interaction of the b-jet with the cold nuclear matter has no effect on the b-jet within uncertainties.

#### Comparison to CMS and ToDo



#### ToDo (Hadi)

- Change the jet probability distribution, and use another discriminator for the templates used in the tagging efficiency determination.
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