Full Event Interpretation: all you need to know

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Why? Purpose of B-tagging

- How? How we do at Belle II
- What? Tool: FEI
- Usage of FEI
- More knowledge: calibration/performance/

Improvements

A typical BB event



A typical BB event (in reality)



Why?

An example of $B^+ \to K^+ \tau^- \tau^+$ event

Up to 4 neutrinos in the final state:

Missing energy \implies Cannot reconstruct invariant mass or energy of the B

But, we have just two B-mesons in one event, and nothing else: can we use this information?



PC: T. Hara







Reconstruct the other *B* **(B-tag):**

 \implies infer the signal *B* kinematics from B-tag and known beam kinematics

Applicable to all missing-energy decays



PC: T. Hara



Which decays should we reconstruct for the B-tag?



No problem, we have computers...

But, first let's agree on the *metrics* that should be the objective of the "tagging" algorithm



Mostly, but not always

(Particle Data Group), Prog.Theor.Exp.Phys Citation: R.L $(65.9^{+3.3}_{-3.5})^{\circ}$ · → D⁰K⁺) = 0.099 $r_B(B^+ \rightarrow D^{*0}K^+) = 0.104^+$ $\delta_B(B^+ \rightarrow D^{*0}K^+) = (314.8^{+7.9}_{-9.0})$ harge conjugates of the

and their assumed D, D $_{
m s}$, D $^{
m *}$, and ψ branching ratios to current values henever this would affect our averages and best limits significantly

ntation is used to indicate a subchannel of a previous reaction. Al esonant subchannels have been corrected for resonance branching fracions to the final state so the sum of the subchannel branching fractions can exceed that of the final state.

For inclusive branching fractions, e.g., $B \rightarrow D^{\pm}X$, the values usually are multiplicities, not branching fractions. They can be greater than one.

						Scale factor/	р
B ⁺ DECAY MODES	Fra	ction (I	;/I)	Co	onfidence level ((MeV/c)
Semileptonic and leptonic modes							
$\ell^+ \nu_\ell X$ [4]	ggg] (10.99	±	0.28)%		-
$e^+ \nu_e X_c$	(10.8	\pm	0.4) %		-
$\ell^+ \nu_\ell X_\mu$	(1.65	\pm	0.21) × 10	-3	-
$D\ell^+ \nu_\ell X$	(9.6	\pm	0.7) %		-
$\overline{D}{}^{0}\ell^{+}\nu_{\ell} \qquad [\ell$	ggg] (2.30	\pm	0.09) %		2310
$D^0 \tau^+ \nu_{\tau}$	(7.7	\pm	2.5) × 10	-3	1911
$\overline{D}^{*}(2007)^{0}\ell^{+}\nu_{\ell}$ [4]	ggg] (5.58	±	0.22) %		2258
$D^{*}(2007)^{0} \tau^{+} \nu_{\tau}$	(1.88	±	0.20) %		1839
$D^{-}\pi^{+}\ell^{+}\nu_{\ell}$	(4.4	±	0.4) × 10	-3	2306
$D^*_0(2420)^0 \ell^+ \nu_\ell, \ D^{*0}_0 \to$	(2.5	±	0.5) × 10	-3	-
$\overline{D}_{2}^{*}(2460)^{0}\ell^{+}\nu_{\ell}, \ \overline{D}_{2}^{*0} \rightarrow D^{-}\pi^{+}$	(1.53	±	0.16) × 10	-3	2065
$D^{(*)} \mathbf{n} \pi \ell^+ \nu_\ell (\mathbf{n} \geq 1)$	(1.85	±	0.25) %		-
$D^{*-}\pi^+\ell^+ u_\ell$	(6.0	\pm	0.4) × 10	-3	2254
$ \begin{array}{c} \overline{D}_1(2420)^0 \ell^+ \nu_\ell, \ \overline{D}_1^0 \rightarrow \\ D^{*-} \pi^+ \end{array} $	(3.03	±	0.20) × 10	-3	2084
HTTP://PDG.LBL.GOV	Page	79		Cr	reated:	7/10/2023	15:48





- High efficiency: fraction of events that are identified as a tag
- High Purity: fraction of identified tags that are "correct"
- Good kinematic information: minimise missing/fake

Total events

Tagged events



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Total events

Tagged events

Correct tags



- High efficiency: fraction of events that are identified as a tag
- High Rurity: fraction of identified tags that are "correct"
- Good kinematic information: minimise missing/fake

In reality: $\mathcal{O}(1\%)$

Total events

Tagged events



- High efficiency: fraction of events that are identified as a tag
- High Purity: fraction of identified tags that are "correct"
- Good kinematic information: minimise missing/fake



Total events

Tagged events

Signal side

Correct tags

The two tagging types

- Hadronic tagging
 - Very low efficiency < O(1%)
 - High purity $\mathcal{O}(10\%)$
 - Excellent kinematic information
- Semi-leptonic tagging
 - Relatively high efficiency $\mathcal{O}(1\%)$
 - Not so good purity
 - Fair kinematic information

Hadronic





Introduction to FEI

- Hierarchical reconstruction of 10⁴ B decay chains
- Uses machine learning: over 200 BDTs are trained using simulated samples
- Training inputs: kinematic variables of the decay chains, such as InvM, momentum, ΔE , M_{bc} etc
- Output
 - List of tag candidates
 - A probability to have correct reconstruction (signal probability)



[T.Keck et. al, Comput Softw Big Sci (2019) 3: 6]





Signal probability



Enhance your purity based on selection on the signal probability

Signal probability: tag-modes



Enhance your purity based on selection on the signal probability

Vidya's thesis BELLE2-PTHESIS-2023-016



How do we select good tags?

Selection on kinematic variables of the tag side:





Select a best tag



Signal prob = 0.0735

Signal prob = 0.0217

Signal prob = 0.1859





Select a best tag



Usage

Training

- You don't need to train the FEI by yourself, it's already trained and validated.
- FEI training weights are uploaded directly to the <u>condition database</u> for you to use: formerly done by W. Sutcliffe, now by analysis tools conveners (Yo Sato, Vidya Sagar)
- What is available now:
 - MC15ri official training: FEIv4_2022_MC15_light-2205-abys
 - Can be used both for MC15ri and MC15rd

In basf2

Load the FEI



Get the tag lists you want:

B+:generic B0:generic B+:semileptonic B0:semileptonic

Hadronic tag candidates

Semileptonic tag candidates

FEIv4_2022_MC15_light-2205-abys

Get the variables you want:

Mbc $\rightarrow M_{bc}$ deltaE $\rightarrow \Delta E$

extraInfo(SignalProbability) $\rightarrow \mathscr{P}_{tag}$ extraInfo(decayModeID) $cosThetaBetweenParticleAndNominalB \rightarrow cos\theta_{RV}$



Get the variables you want:

 $\begin{array}{l} \text{Mbc} \longrightarrow M_{bc} \\ \text{deltaE} \longrightarrow \Delta E \end{array}$

extraInfo(SignalProbability) $\rightarrow \mathscr{P}_{tag}$ extraInfo(decayModeID)

 $cosThetaBetweenParticleAndNominalB \rightarrow cos$

```
D0.addChannel(['K-', 'pi+'])
D0.addChannel(['K-', 'pi+', 'pi0'])
D0.addChannel(['K-', 'pi+', 'pi0', 'pi0'])
D0.addChannel(['K-', 'pi+', 'pi+', 'pi-'])
D0.addChannel(['K-', 'pi+', 'pi+', 'pi-', 'pi0'])
                                                        D CK
D0.addChannel(['pi-', 'pi+'])
D0.addChannel(['pi-', 'pi+', 'pi+', 'pi-'])
D0.addChannel(['pi-', 'pi+', 'pi0'])
D0.addChannel(['pi-', 'pi+', 'pi0', 'pi0'])
D0.addChannel(['K_S0', 'pi0'])
D0.addChannel(['K_S0', 'pi+', 'pi-'])
D0.addChannel(['K_S0', 'pi+', 'pi-', 'pi0'])
D0.addChannel(['K-', 'K+'])
D0.addChannel(['K-', 'K+', 'pi0'])
D0.addChannel(['K-', 'K+', 'K_S0'])
```

$$\begin{aligned} \mathfrak{G}_{\mathrm{BY}} & \begin{array}{c} 0: & B^0 \to D^- \pi^+ \\ 1: & B^0 \to D^- \pi^+ \pi^0 \\ 2: & B^0 \to D^- \pi^+ \pi^0 \pi^0 \\ 3: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 4: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 4: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 4: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 4: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 5: & B^0 \to D^- D^0 K^+ \\ 7: & B^0 \to D^- D^0 K^+ \\ 8: & B^0 \to D^- D^- N K^0_S \\ 7: & B^0 \to D^- D^- N K^0_S \\ 8: & B^0 \to D^- D^- N K^0_S \\ 9: & B^0 \to D^- D^- N K^0_S \\ 11: & B^0 \to D^- D^- K^0_S \\ 12: & B^0 \to D^- D^+ K^0_S \\ 13: & B^0 \to D^- D^+ K^0_S \\ 13: & B^0 \to D^- \pi^+ \pi^0 \\ 15: & B^0 \to D^- \pi^+ \pi^0 \\ 16: & B^0 \to D^- \pi^+ \pi^0 \\ 17: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 17: & B^0 \to D^+ \pi^+ \pi^+ \pi^- \\ 19: & B^0 \to D^+ \pi^+ \pi^+ \pi^- \\ 19: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 19: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 19: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 19: & B^0 \to D^- \pi^+ \pi^+ \pi^- \\ 20: & B^0 \to D^+ R^+ D^- \\ 21: & B^0 \to D^- R^+ R^0 \\ 22: & B^0 \to D^- R^+ R^- \\ 23: & B^0 \to J / \psi K^0_S \\ 24: & B^0 \to J / \psi K^0_S \\ 24: & B^0 \to J / \psi K^0_S \\ 24: & B^0 \to J / \psi K^0_S \\ 24: & B^0 \to D^- p^+ p^- \pi^+ \\ 25: & B^0 \to D^- p^+ p^- \pi^+ \\ 25: & B^0 \to D^- p^+ p^- \pi^+ \\ 25: & B^0 \to D^- p^+ p^- \pi^+ \\ 26: & B^0 \to D^- p^+ p^- \pi^+ \\ 28: & B^0 \to D^- p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 29: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^0 \to D^0 p^+ p^- \pi^+ \pi^- \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \pi^- \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \pi^- \\ 20: & B^+ \to D^0 p^+ p^- \pi^+ \pi^- \\ 20: & B^+ \to D^0$$

FEI skims

Skim code:

Skim cuts:

Hadronic: 11180500

SL: 11180600

FEI skims are also ready for MC15rd

SL&ME	FEI	feiHadronic
Liaison: @Shanette Anne De Lamotte		
Prep: BIIDP-5737 Requests: BIIDP-6059		feiSL

static fei_precuts(path)

Skim pre-cuts are applied before running the FEI, to reduce computation time. This setup function is run by all FEI skims, so they all have the save event-level pre-cuts:

- $ullet n_{ ext{cleaned tracks}} \geq 3$
- $n_{
 m cleaned\ ECL\ clusters} \geq 3$
- Visible energy of event (CMS frame) > 4 GeV

We define "cleaned" tracks and clusters as:

• Cleaned tracks (pi+:FEI_cleaned): $d_0 < 0.5~{
m cm}$, $|z_0| < 2~{
m cm}$, and $p_T > 0.1~{
m GeV}$ * Cleaned ECL clusters (gamma: FEI_cleaned): $0.296706 < \theta < 2.61799$, and $E>0.1~{
m GeV}$

		MC15ri	Proc13	Prompt	MC15rd
11180500	Hadron	Ready* *with ECL cut:	Ready* *with ECL cut: release-06-	Ready* *with ECL cut:	Ready* *WITHOUT ECL cut: release- 06-01-12
11180600		06-01-10 WITHOUT ECL cut: release- 06-01-12	WITHOUT ECL cut: release-06- 01-12	06-01-10 WITHOUT ECL cut: release- 06-01-12	

Mind the release!!





In analysis

You have your tag now, what do you do?

Analysis w/o FEI



*e*Sig

- Build your signal-side *B* candidate
- Combine tag-side *B* and signal-side *B* to form $\Upsilon(4S)$ candidates



Analysis w/ FEI











Fit variables



Fit to the recoil mass of *B*-tag and a pion on the signal side

[Karim, Meihong, Niharika, Vidya]

Yield: ~ 10^5 , High statistics, low purity



Calibration factors are calculated as ratio of signal yields of data and MC

Yield: ~ 10^4 , Low statistics, high purity



Good agreement of CFs despite two orthogonal signal-sides



CFs are ready and available for the analysts to use

KEKCC: /hsm/belle2/bdata/users/sutclw/fei_calibration/hadronic_FEI_calibration_factors/v1







Calibration: semileptonic tag



Total CF: (1.09 ± 0.10)

CFs are also available for semileptonic tagging





Tag-side selections

Mode \$	Cuts post FEI skim	BCS	Signal Probability Working Points
Had Tag	Mbc > 5.27, -0.15 < deltaE < 0.1, cosTBTO < 0.9	Highest extraInfo(SignalProbability)	0.001, 0.01, 0.1
SL Tag	-4 < cosThetaBetweenParticleAndNominalB < 3, cosTBTO < 0.9	Highest extrainfo(SignalProbability)	0.001, 0.01, 0.1

ECL Mask:

```
ecl_mask = "[[clusterReg==1] and [E>0.080]] or [[clusterReg==2] and [E > 0.03]] or [[clusterReg==3] and [E > 0.06]]]" \land
 "and [clusterNHits > 1.5] and [abs(clusterTiming) < 200] and [0.2967 < clusterTheta < 2.6180]]"
```

Track Mask:

track mask = "[[dr < 2] and [abs(dz) < 4] and [pt > 0.2] and[thetaInCDCAcceptance==1]]"

If you use different selections, you need to do the calibration by yourself





Next generation FEI: improving the metrics

Reference: <u>Vidya's</u> talk at PGM



FEI performance in data

Calculated directly on data

• Calibration factor:

Signal yield in data Signal yield in MC

• Purity:

Signal yield

Signal yield + Background yield in signal region

• Efficiency:

Signal yield $n_{BB} \cdot BF_{B \rightarrow D\pi} \cdot \epsilon_{\pi}$ $\downarrow \qquad \downarrow \qquad \downarrow$ $392.5 \times 10^{6} \text{ PDG} 90\%$



FEI performance in data: current status

Calculated directly on data

65% • Calibration factor: Signal yield in data Signal yield in MC • Purity: 56% Signal yield Signal yield + Background yield in signal region 0.93% • Efficiency: Signal yield n_{BB} . $BF_{B \rightarrow D\pi}$. ϵ_{π} 392.5×10^{6} PDG 90%



What affects our current performance?

Calculated directly on data

Calibration factor: 65%

Signal yield in data Wrong/outdated BFs in MC yield in MC

Purity Half of the MC is unknown: PYTHIA

Bugs or very loose selections applied in FEI
 Signal yield + Background yield in signal region
 Efficient Wrong choice of input training variables gion

Signal yield

 $n_{BB} \cdot BF_{B \to D\pi} \cdot \epsilon_{\pi}$ $\downarrow \qquad \downarrow \qquad \downarrow \qquad \downarrow$ $392.5 \times 10^{6} \text{ PDG} \quad 90\%$



Understanding our MC



Why such large discrepancy with data?

Let's understand our MC...





Understanding our MC

Hadronic *B*-decays: ~75% Only half of it is measured and the rest is generated by PYTHIA

Most of the known measurements are performed with small data sets \Rightarrow Large statistical uncertainties.





Poor MC (significantly different from reality/data) \implies Poor hadronic B-tagging

Understanding $B \rightarrow D^{(*)}h$ decays is essential for B-tagging.



Decays in hadronic B-tagging

ARGUS, 229 pb^{-1,} 33 years ago Uses M_{bc} as fit variable $\mathscr{B} = (1.5 \pm 0.7)\%$, 47% uncertainty!



M (GeV/ c^2)

Decays in hadronic B-tagging



[PRD 64 (2001) 092001]



38

5.30

M_B Sideband

AE Sideband

2.5

M_{яяяя} (GeV)

3.0

Updating our MC

Decay model of B mesons is made of explicitly listed decays in DECAY.DEC + $\sim 40\%$ unknown decays modelled by PYTHIA.

Better interpretations of measurements:

- Correcting misinterpretations of inclusive BF measurement as non-resonant component.
- Avoiding PYTHIA generating additional components
- Updating the decay model of D^{**}
- Removing obviously wrong components

New MC is produced: MC15ri-up and also official for future Belle II production.

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[Karim, Meihong, Niharika, Vidya]

MC is first modified based on our best understanding. And $D\pi$ sample is used to validate.







Updated CF



40

Overall calibration factor: 65% 283% For the top 10 decay modes: 68% 292% [Karim, Meihong, Niharika, Vidya]

Reminder MC is first modified based on our best understanding. And $D\pi$ sample is used to validate.





Decay kinematics improves too...



Overall calibration factor: 65% 283%

Decay kinematics improves too...



Overall calibration factor: 65% 283%

Also, better signal probability.



What's left: need more measurements...



Now limited by:

- > 15% of the total efficiency.

How does our MC look now





Training with new MC



Training with new MC

Background decreases Better signal probability agreement both for signal and background

[Karim, Vidya]

Also, the slow π^0 efficiency is fixed and mass constraint is added.

Training weights publicly available: light-2205-abys_fei_retrain_3

Overall improvement

- Updated decay model for 11 most efficient B decay modes
- Training with the new MC
 - 56% → 63% : **12%** in purity
- Loosen the γ preselection and mass-constraint π^0
 - $0.93\% \rightarrow 1.13\% : 21\%$ in efficiency

$0.65 \rightarrow 0.81$: 25% in Calibration factor

Training weights publicly available: light-2205-abys_fei_retrain_3

Timeline for FEI

For winter 2024 conferences :

- Use MC15rd + light-2305-korat (or earlier)
- Use existing training i.e., no improvements
- Skims and calibration available
- Use MC15ri-up for validations

For summer 2024 conferences:

- Use MC15rd-up + light-2307-laperm (or later)
- Skimming and calibration should be repeated.

Retrain with new MC and new precuts i.e., all improvements

Questions?

- Ask now!!!
- or email at:

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Backup

At different sig-prob cuts

The agreement gets better when the sig-prob cut is tighter for the $Xe\nu$ case, i.e, when the purity is better

Backup

Backup

At different sig-prob cuts

Tighter sigProb cut

- \Rightarrow higher purity
- \Rightarrow Certain components are enhanced than others
- \Rightarrow In this case, the enhanced one is old & bad measurement
- \Rightarrow Decreasing the CF

The agreement gets better when the sig-prob cut is tighter for the $Xe\nu$ case, i.e, when the purity is better

Signal-side dependency

 \succ \succ

Slow π^0 s in Belle II FEI

Now unified with Belle selections

Belle II because of a tighter

Important for SL-tagging also

Also, there is no mass constraint for π^0 in Belle II

Improvements in the decay table

- $\eta\pi$ is fixed based on predictions to fill SL gap
- For $\rho\pi\pi$, we let PYTHIA generate it.
- The fraction of 4 different D^{**} is fixed based on observations.

Happens through 2 channels, one with spectator quarks (call Y) and one from the W (call X).

> We modified the DECAY table to latest PDG/paper interpretations and this model to see the impact.

Essentially validation, we didn't do any fine-tuning (except set 0 there is no signal*).

FEI algorithms: better with cuts

Currently, we have train BDTs for each everything in FEI... even for FSPs!

Unnecessarily duplicating the work of many dedicated performance groups?

Can adopting standard lists and minimal cuts with standard tools (like beamBackgroundSuppressionBDT) bring more stability?

Added bonus: Less resource expensive