

# HF O<sup>2</sup> analysis framework

*Vít Kučera*, Francesco Prino,  
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on behalf of the HF O<sup>2</sup> team

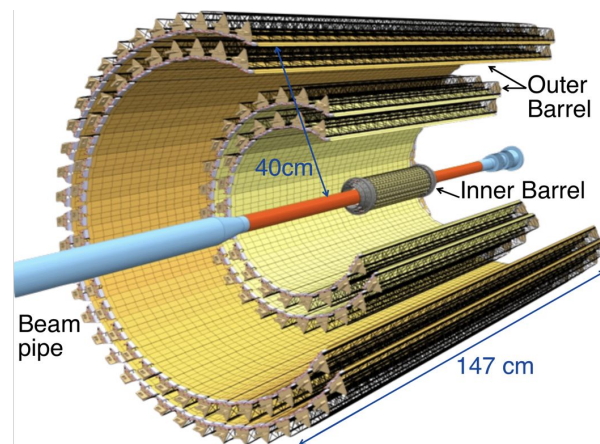
HF O<sup>2</sup> hackathon  
7 Dec 2021

# HF challenges in Run 3

Precise HF measurements down to  $p_T = 0$

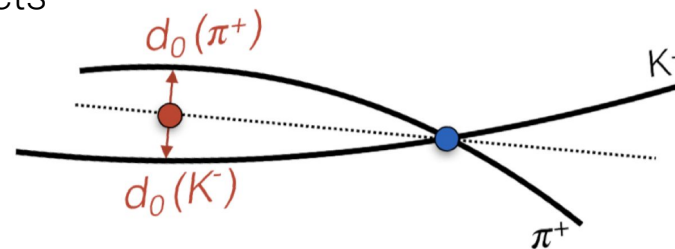
- 100 times more Pb–Pb data than in Run 2
- Large combinatorial background
- Small S/B ratio, difficult triggering

→ HF reconstruction and selection as the most challenging analysis process in Run 3



Framework-design requirements:

- Minimize disk space occupied by derived analysis objects
- Maximize CPU performance
- Flexible structure, skims,...



A special thanks and a lot of credit to those who developed, optimized and maintained the AliPhysics heavy-flavour software from which we enormously profited (A. Rossi's talk!)

HF reconstruction and  
analysis in  $O^2$

# Recap of the $O^2$ analysis framework

## Data format and handling

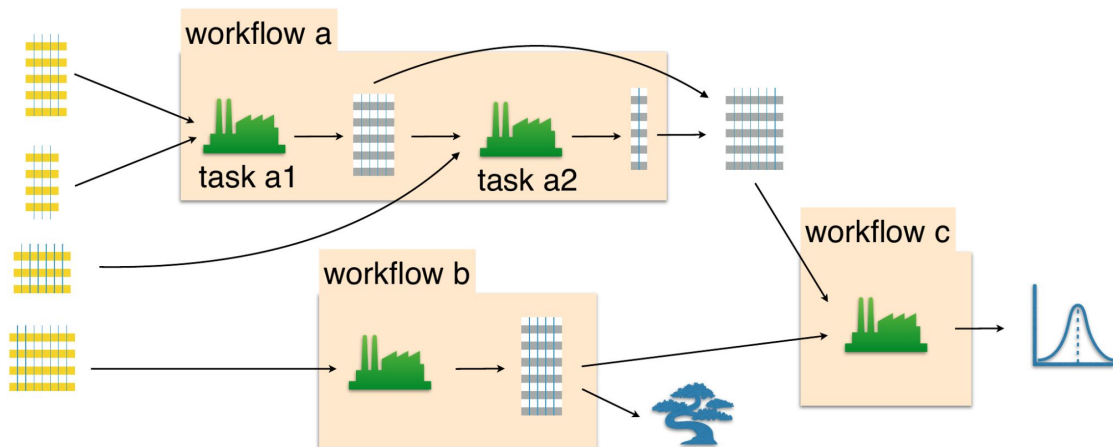
- Data stored in flat tables
- Tables interlinked via indices

## Table processing

- Declarative/imperative

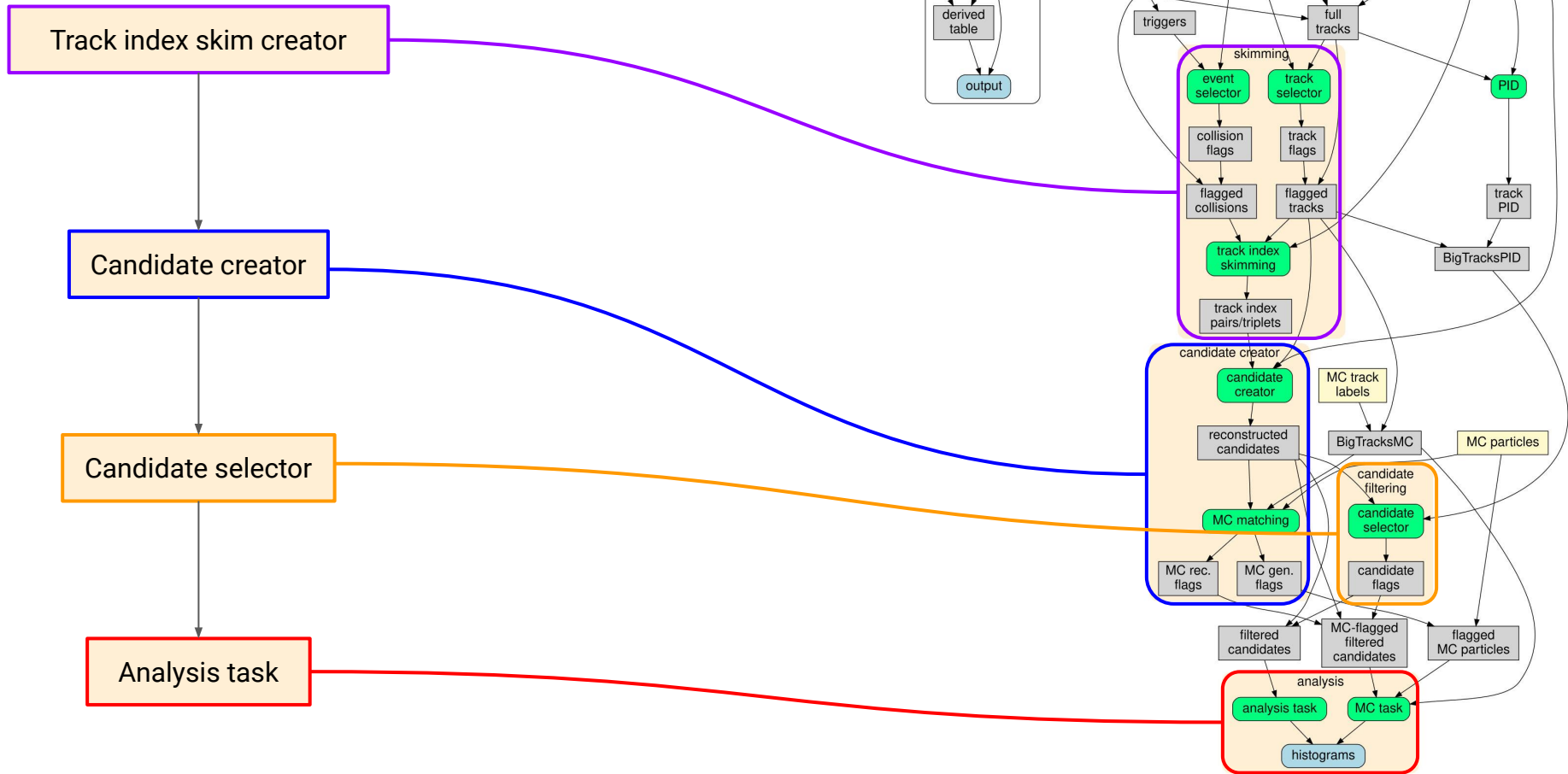
## Tasks and configuration

- Tasks organised in workflows
- Subscriptions to input tables determine topology.
- Configuration via JSON

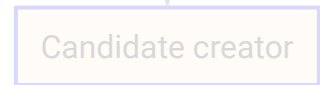
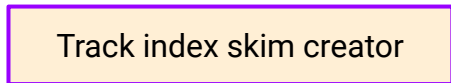


See Anton's talk

# HF $O^2$ analysis framework



# Track skim creator



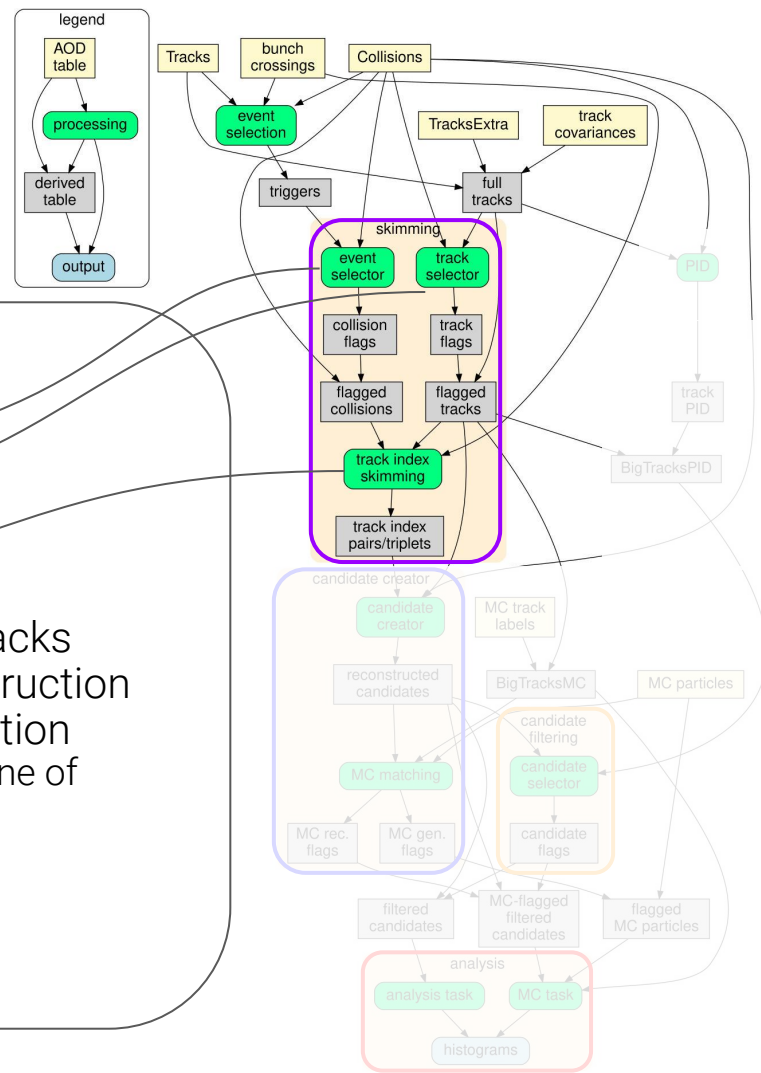
Input: tracks, collisions

## Event selection

## Track selection

- $p_T$ ,  $\eta$ , DCA, quality
- ### Skimming
- Double/triple loop over tracks
  - Secondary-vertex reconstruction
  - Loose candidate preselection
    - invariant mass,  $p_T$ , cosine of pointing angle,...

Output: track skims (skimmed pairs/triplets of track indices)



# Candidate creator

Track index skim creator

Candidate creator

Candidate selector

Analysis task

Input: track skims

## Candidate creation

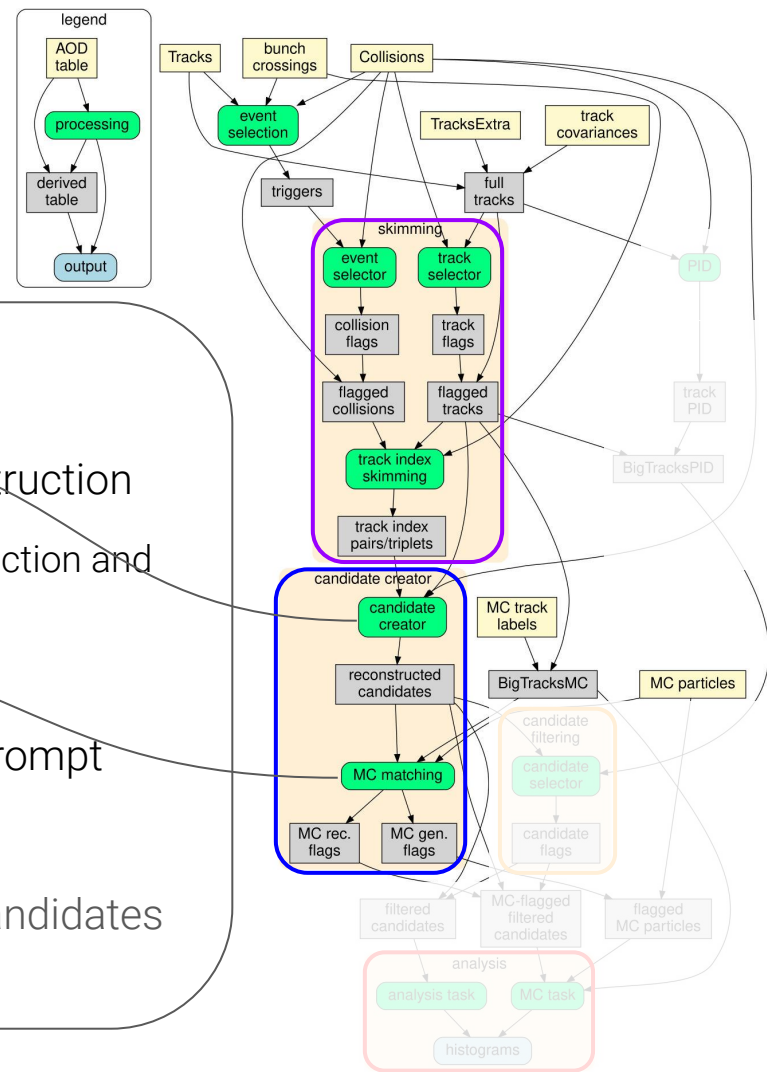
- Secondary-vertex reconstruction
- Candidate building
  - full information for selection and analysis

## MC matching

- Rec. level (candidate)
- Gen. level (MC particle)
- MC origin tracing (non-)prompt
  - (from c/b quark)

Output:

- Fully reconstructed HF candidates
- MC flags



# Candidate selector

Track index skim creator

Candidate creator

Candidate selector

Analysis task

Input:

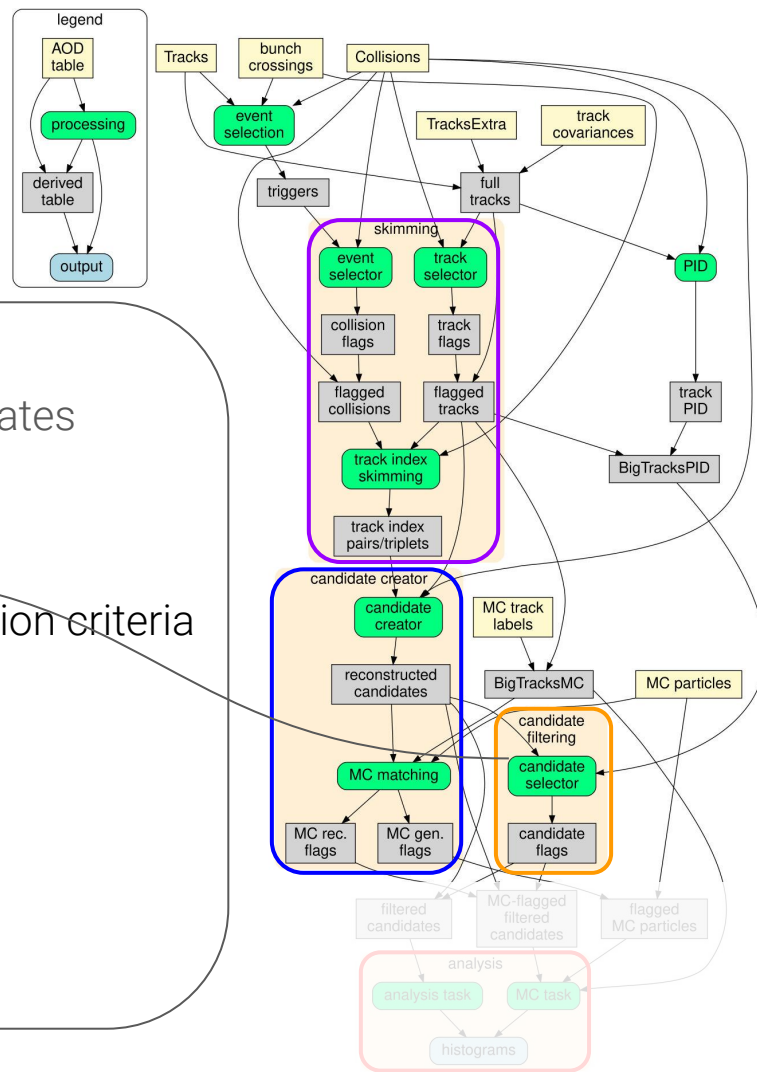
- Reconstructed HF candidates
- Track PID

## Candidate selection

Application of candidate selection criteria

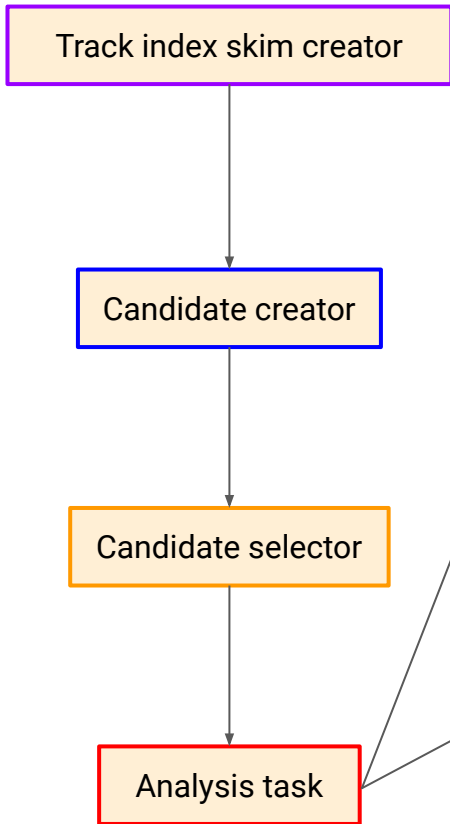
- Topological cuts
- Daughter PID cuts

Output: selection flags





# Analysis task



Input:

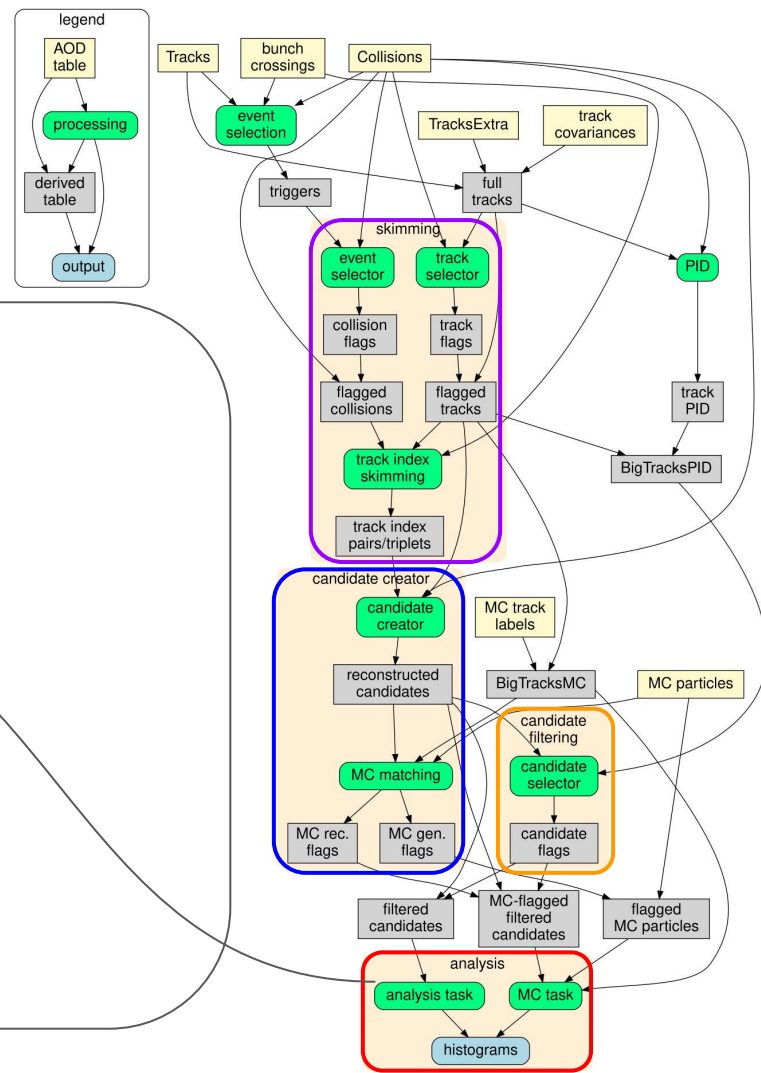
- Selected candidates
- MC particles
- MC flags

## Analysis task

- Filter application
- Histogram filling

Output: histograms

- Kinematic properties
- Signal vs. background
- Reconstruction efficiency
- Prompt vs. non-prompt



# More complex analyses

Modularity of O<sup>2</sup> workflows allows to build analyses of multi-stage decays on top of analyses of direct decays.

E. g.:  $B^+ \rightarrow D^{0\text{bar}} \pi^+$ :

Track skim creator

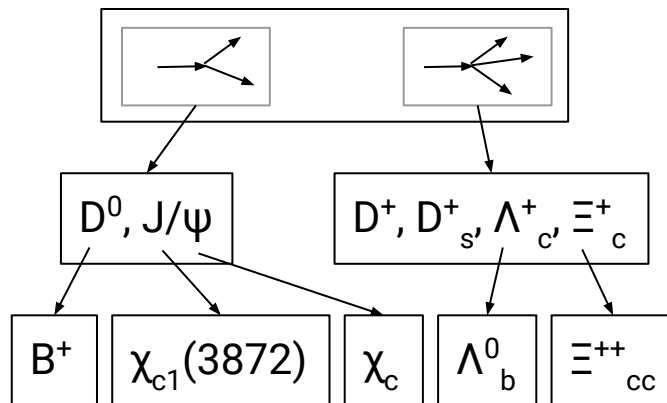
→ 2-prong candidate creator

→  $D^0$  selector

→  $B^+$  candidate creator

→  $B^+$  candidate selector

→  $B^+$  analysis task



$$D^0 \rightarrow \pi^+ K^-$$

$D^{0/+} - D^{0\text{bar}/-}$  correlations

$$B^+ \rightarrow D^{0\text{bar}} \pi^+$$

$$D^+ \rightarrow \pi^+ K^- \pi^+$$

$$D_s^+ \rightarrow \pi^+ K^- K^+$$

$$\Lambda_c^+ \rightarrow p K^- \pi^+$$

$$\Xi_c^+ \rightarrow p K^- \pi^+$$

$$\Xi_c^{++} \rightarrow \Xi_c^+ \pi^+$$

$$\Lambda_c^+ \rightarrow p K_S^{0\text{cc}}$$

$$J/\psi \rightarrow e^+ e^-$$





































$$J/\psi \rightarrow \mu^+ \mu^-$$

$$\chi_{c1}(3872) \rightarrow J/\psi \pi^+ \pi^-$$

$$\chi_c \rightarrow J/\psi \gamma$$

# Heavy-flavour analyses on AliHyperloop

All HF  $O^2$  workflows configured as wagons on the Grid and tested on converted Run 2 data sets

Wagon	LHC15o_test	LHC20a7_cent	LHC17pp_test	LHC20e3a	LHC17p_pass1	LHC17q_pass1	LHC20g2a_2	Last run																																																																																																																																																														
hf-candidate-creator-2prong	✗	✗	✗	✗	✗	✗	✗	4402	 																																																																																																																																																													
hf-candidate-creator-3prong	✗	✗	✗	✗	✗	✗	✗	4581	 																																																																																																																																																													
hf-candidate-creator-cascade	✗	✗	✗	✗	✗	✗	✗		 																																																																																																																																																													
hf-candidate-selector-D0-toKPi	✗	✗	✗	✗	✗	✗	✗	4402	 																																																																																																																																																													
hf-candidate-selector-DPlus-toPKPi	hf-candidate-selector-D0-toKPi						✗	✗	 																																																																																																																																																													
hf-candidate-selector-Jpsi	D0_to_pi_K_cuts						✗	✗	 																																																																																																																																																													
hf-candidate-selector-Lc-toPKPi	<table><thead><tr><th>#</th><th>m</th><th>DCA</th><th>cos theta*</th><th>pT K</th><th>pT PI</th><th>d0K</th><th>d0pi</th><th>d0d0</th><th>cos pointing angle</th><th>cos pointing angle xy</th><th>normalized dec</th></tr></thead><tbody><tr><td>pT bin 0</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.5</td><td>0.5</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.8</td><td>0</td><td>0</td></tr><tr><td>pT bin 1</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.5</td><td>0.5</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.8</td><td>0</td><td>0</td></tr><tr><td>pT bin 2</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.4</td><td>0.4</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.8</td><td>0</td><td>0</td></tr><tr><td>pT bin 3</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.4</td><td>0.4</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.8</td><td>0</td><td>0</td></tr><tr><td>pT bin 4</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.7</td><td>0.7</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.9</td><td>0</td><td>0</td></tr><tr><td>pT bin 5</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.7</td><td>0.7</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.9</td><td>0</td><td>0</td></tr><tr><td>pT bin 6</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.7</td><td>0.7</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.85</td><td>0</td><td>0</td></tr><tr><td>pT bin 7</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.7</td><td>0.7</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.85</td><td>0</td><td>0</td></tr><tr><td>pT bin 8</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.7</td><td>0.7</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.85</td><td>0</td><td>0</td></tr><tr><td>pT bin 9</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.7</td><td>0.7</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.85</td><td>0</td><td>0</td></tr><tr><td>pT bin 10</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.7</td><td>0.7</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.85</td><td>0</td><td>0</td></tr><tr><td>pT bin 11</td><td>0.4</td><td>0.03</td><td>0.8</td><td>0.7</td><td>0.7</td><td>0.1</td><td>0.1</td><td>-0.00</td><td>0.85</td><td>0</td><td>0</td></tr></tbody></table>						#	m	DCA	cos theta*	pT K	pT PI	d0K	d0pi	d0d0	cos pointing angle	cos pointing angle xy	normalized dec	pT bin 0	0.4	0.03	0.8	0.5	0.5	0.1	0.1	-0.00	0.8	0	0	pT bin 1	0.4	0.03	0.8	0.5	0.5	0.1	0.1	-0.00	0.8	0	0	pT bin 2	0.4	0.03	0.8	0.4	0.4	0.1	0.1	-0.00	0.8	0	0	pT bin 3	0.4	0.03	0.8	0.4	0.4	0.1	0.1	-0.00	0.8	0	0	pT bin 4	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.9	0	0	pT bin 5	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.9	0	0	pT bin 6	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.85	0	0	pT bin 7	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.85	0	0	pT bin 8	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.85	0	0	pT bin 9	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.85	0	0	pT bin 10	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.85	0	0	pT bin 11	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.85	0	0	✗	✗	4580	 
#	m	DCA	cos theta*	pT K	pT PI	d0K	d0pi	d0d0	cos pointing angle	cos pointing angle xy	normalized dec																																																																																																																																																											
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pT bin 11	0.4	0.03	0.8	0.7	0.7	0.1	0.1	-0.00	0.85	0	0																																																																																																																																																											
hf-candidate-selector-Xic-toPKPi							✗		 																																																																																																																																																													
hf-mc-validation							✗		 																																																																																																																																																													
hf-qa-efficiency							✗		 																																																																																																																																																													
hf-task-D0							✓	4402	 																																																																																																																																																													
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<https://alimonitor.cern.ch/hyperloop>

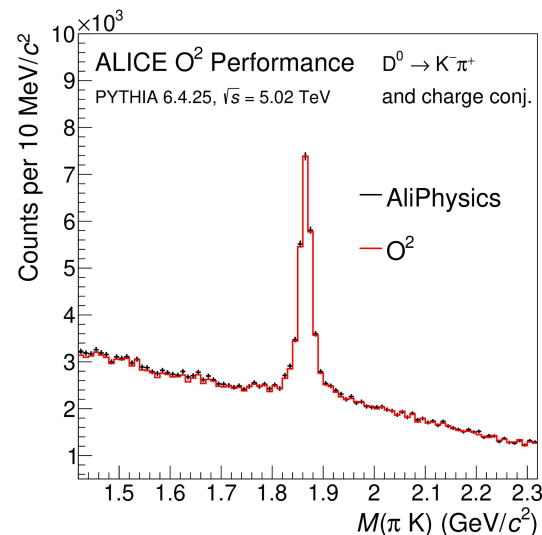
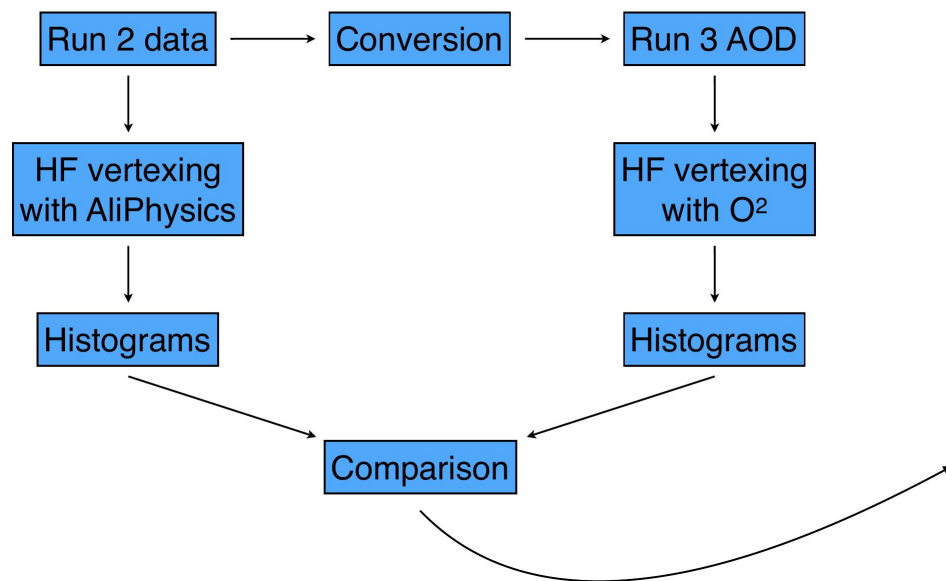
# Validation framework

# Validation framework

Tool for an easy execution, testing and validation of O<sup>2</sup>Physics tasks

<https://github.com/AliceO2Group/Run3Analysisvalidation>

- ESD → AO2D conversion
- Flexible execution of arbitrary [Ali/O<sup>2</sup>]Physics analysis tasks
- Job parallelisation, output merging, error checking, postprocessing
- Easy generation of the O<sup>2</sup> command from a database of workflows and options



# Execution steps

Run: `bash runtest.sh` (symlinked in `codeHF`)

- Load settings
  - Set parameters based on specified input and requested tasks
- Clean directory
  - Delete files produced by previous runs
- Generate list of input files
- Modify JSON file
  - Activate MC, apply candidate selection, set collision system, Run 2/3/5,...
- Run ESD → AO2D conversion
- Run AliPhysics tasks
- Run O<sup>2</sup>Physics tasks
- Run postprocessing
  - Comparison AliPhysics vs O<sup>2</sup>, efficiency plots,...
- Clean directory
  - Delete temporary files

# Input configuration

`config_input.sh` defines what data will be processed and how.

`NFILESMAX` Maximum number of processed input files

`NFILESJOB_[CONVERT, ALI, 02]` Number of input files per [conversion, AliPhysics,  $O^2$ ] job

`NJOBSPARALLEL_02` Maximum number of simultaneously running  $O^2$  jobs

`JSON` Path to the JSON file (`dp1-config.json`)

`INPUT_LABEL` Data description

`INPUT_DIR` Input directory

`INPUT_FILES` Input file pattern

`INPUT_SYS` Collision system

`INPUT_RUN` Run (2, 3, 5)

`ISMC` Is the input MC data? (0, 1)

`ISINPUT02` Is the input in the  $O^2$  format? (0, 1)

`ISALICE3` Is the input from the ALICE 3 detectors? (0, 1)

# Task configuration

`config_tasks.sh` defines which steps will be executed and what they will do.

- Generates job scripts: `script_ali.sh`, `script_o2.sh`, `script_postprocess.sh`

Step activation: `DOCLEAN`, `DOCONVERT`, `DOALI`, `D002`, `D0POSTPROCESS`

Activation of O<sup>2</sup> workflows: `D002_SKIM`, `D002_SEL_D0`, `D002_TASK_D0`, `D002_...`

Application of selection cuts: `APPLYCUTS_D0`

Save derived tables as trees: `SAVETREES`

`AdjustJson` Function that modifies the JSON file based on the input parameters

`MakeScriptO2` Function that generates the O<sup>2</sup> script containing the full O<sup>2</sup> command

- O<sup>2</sup> command generated by a Python script based on a YAML database of workflows, their dependencies and options (`workflows.yml`).



# How to add a new workflow

1. Add the workflow specification in the database (`workflows.yml`).

`o2-analysis-hf-my-analysis-wf:`

`executable:` Name of the workflow executable

Allows to define the same workflow multiple times with different names and options.

`dependencies:` Required workflows (follows table subscriptions)

`requires_mc:` Does the workflow require MC input?

`options:` Command line options

Format: `str`, `list` or `dict` (if `dict`: `default`, `real`, `mc`)

`tables:` Derived tables, same format as `options`

Unnecessary settings can be omitted.

2. Add the workflow activation in the task configuration (`config_tasks.sh`).

```
D002_MYWF=0
```

```
[ $D002_MYWF -eq 1 ] && WORKFLOWS+=" o2-analysis-hf-my-analysis-wf"
```

3. Add the workflow configuration in the JSON file (`dpl-config.json`).

```
"my-analysis-task": {...}
```

## Extras

## Debugging mode

See more details in the terminal

```
bash runtest.sh -d
```

## Job debugging tool

## Display bad jobs, their input, warnings, errors

```
bash exec/debug.sh
```

## Maintenance tool

## Sync Git repos (upstream/master, origin/mybranch)

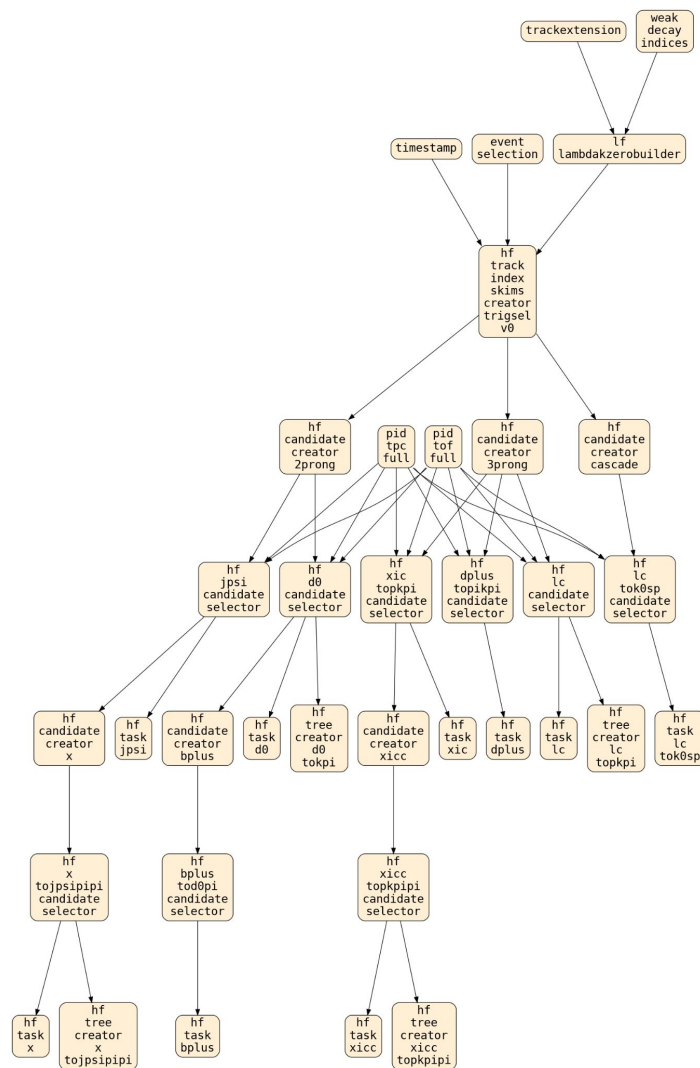
## Build packages with aliBuild

## Delete obsolete builds (deeper cleanup)

```
bash exec/update_packages.sh
```

## Dependency diagram

Set `MAKE_GRAPH=1` in `config_tasks.sh`



# References and useful information

Mattermost: <https://mattermost.web.cern.ch/alice/channels/hf-o2-analysis-challenge>

Documentation:

<https://aliceo2group.github.io/analysis-framework/docs/framework/pwghf.html>

O<sup>2</sup>Physics code:

<https://github.com/AliceO2Group/O2Physics/tree/master/PWGHE>

Validation framework & postprocessing analysis tools:

<https://github.com/AliceO2Group/Run3Analysisvalidation>

Meetings:

- Weekly HF O<sup>2</sup> meetings: Tue 9:30, <https://indico.cern.ch/category/9431/>  
→ Core HF development, utilities, processing, MC tools,...
- PAG/PWGHE meetings for all the analysis-related discussions

Ongoing developments:  
getting ready for real analyses!

# Ongoing activities and topic “task forces”

HF O<sup>2</sup> framework is in an advanced state of development, but there is still a lot of work to do!

Four major areas of developments identified with the help of HF conveners and HF experts:

## MC correction and reweighting

- Strategy for MC-based efficiency and selection corrections
- MC generation/configuration for HF simulation
- Multidimensional MC-reweighting to improve MC/data agreement

## ML application, model preservation and selector refactory

- Application of training models with local and Grid resources
- ML model storage and long-term preservation
- “Modular” refactory of the selector classes:
  - Multi-purpose software unit to perform both rectangular or ML-based selection

# Ongoing activities and topic “task forces”

HF  $O^2$  framework is in an advanced state of development, but there is still a lot of work to do!

Four major areas of developments identified with the help of HF conveners and HF experts:

## Post-processing (after $O^2$ processing) macros and QA:

- Optimization of the code to analyze the  $O^2$  outputs to produce final results for analyses
  - Efficiency macros, cross section calculations, fitting, feed-down subtraction
- Optimized validation for HF MC simulations and reconstructed data

## Skim creation, size/CPU estimation, triggering

- Optimize structure of derived data creation (*track skims, candidate skim, trees for offline optimization*)
- Processing using derived data as starting point
- Resource estimation and optimization
- Triggering strategy (based on the track skims)

# Conclusions

- Data are about to come, and it is still to complete and polish our software!
- The contribution from the “analysis” community is now really critical.
  - **Experts to help the steering** of the projects and new developers
- **The menu of today**
  - Hands on session for analysis in  $O^2$
  - Hands on sessions for HF analysis in  $O^2$
  - Time for discussion!

Thanks for your attention