"Analysis Software in Key4HEP and beyond"

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## **Existing RDataFrame based framework**

Python-based RDataFrame code w/ C++ helper Supports various selection and plotting stages and has lots of examples

https://github.com/HEP-FCC/FCCAnalyses/tree/master

fccanalysis run examples/FCCee/higgs/mH-recoil/mumu/analysis\_stage1.py fccanalysis run examples/FCCee/higgs/mH-recoil/mumu/analysis\_stage2.py fccanalysis final examples/FCCee/higgs/mH-recoil/mumu/analysis\_final.py fccanalysis plots examples/FCCee/higgs/mH-recoil/mumu/analysis\_plots.py

We wanted to add support for doing similar analyses using Coffea and other Python tools that have grown out of the US LHC community



## **COFFEA and the Python Ecosystem**

- **Uproot** to read and write root files.
- Awkward Array to manipulate HEP data in a numpythonic way.
- **Dask** to for scaling-out
- **Hist** for histogramming
- **MPLHEP** for plotting
- Numba for just-in-time compilation
- and other useful packages ...





#### **Project Goals**

- 1. Add support for EDM4HEP schemas to Coffea
  - Coffea schemas play the role of building logical groups of branches -- collections and relationships between branches to represent physical objects and their connections-- and helper functions that reduce boilerplate code
  - There is a recent major break in compatibility, but in any case, one aspect of this support is supporting different EDM4HEP schemas
- 2. Build and document several demonstrators based on Coffea and EDM4HEP simulation samples

\* Prayag Yadav is doing much (essentially all) of this work as part of a NSF HSF-India fellowship project (with Princeton/Univ. of Hyderabad)

#### **Project Status**

 "Old"-style EDM4HEP files (including Winter2023 FCC samples) are now supported by recent Coffea versions (from 2024.10.0)

```
from coffea.nanoevents import NanoEventsFactory, BaseSchema, FCC
fcc = FCC.get_schema("pre-edm4hep1")
fcc
coffea.nanoevents.schemas.fcc.FCCSchema
events = NanoEventsFactory.from_root(
    '../coffea-fcc-analyses/data/wzp6_ee_mumuH_Hbb_ecm240/events_159112833.root:events',
    schemaclass=fcc,
    entry_stop=100,
    metadata={'dataset':'ZH'},
    delayed=False,
    uproot_options={"filter_name": lambda x : "PARAMETERS" not in x}
).events()
```

#### Technical performance and Physics results are as expected



• Only simple benchmarking done, but no significant performance differences (Coffea was faster on our test case)

## Work in progress

- Working through support for "New"-style files as well as a general solution building the Coffea schema with help of the Podio YAML specification (future proofing)
- Finishing up documented examples to include in Key4Hep (
  - First two examples are clones of the Z(mumu)H recoil analysis and a jet clustering analysis from fccanalysis.
  - Key4Hep stack is not required for use but is a convenient way to make this discoverable
  - Some more details at <a href="https://indico.cern.ch/event/1487970/#1-coffea-and-fcc">https://indico.cern.ch/event/1487970/#1-coffea-and-fcc</a>

# "Beyond"

- Developer/User environment
  - Constantly improving but considerable space to improve (and in particular towards getting new students started)
- Make existing full sim algorithms better
  - Add threading support
  - Transition from wrappers to native Gaudi algorithms
  - Technical performance
- Bring algorithms into key4hep and make them work for proto detectors
- Longer term Apply new approaches to future collider detector design
  - Eg, differentiable pipelines or simulation based inference techniques?

# Proposed workshop on "Software & Computing: From LHC to Future Colliders"

- Workshop and training event proposed for late winter (possibly week of February 24-28) hosted at Princeton University.
- Possible goals for questions to answer:
  - Needs: What does the US community need in terms of software and computing for Future Collider studies?
  - Resources: Are there opportunities for the future collider effort to align with and/or leverage existing S&C projects (HEP-CCE, IRIS-HEP, etc.)? What similar collaborations are possible with CERN and other international efforts?
  - Near term goals: What concrete things could be accomplished over the next 12 months?
  - An associated training event could cover modern software tools, Key4Hep, etc.
- Partial support can be provided by the NSF-funded IRIS-HEP software institute as an "ecosystems/blueprint" workshop and training event.