

Status of CEPC Offline Software

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Contents

- ❖ Introduction
- ❖ Overview of CEPCSW
- ❖ Status and new development of CEPCSW
- ❖ Summary

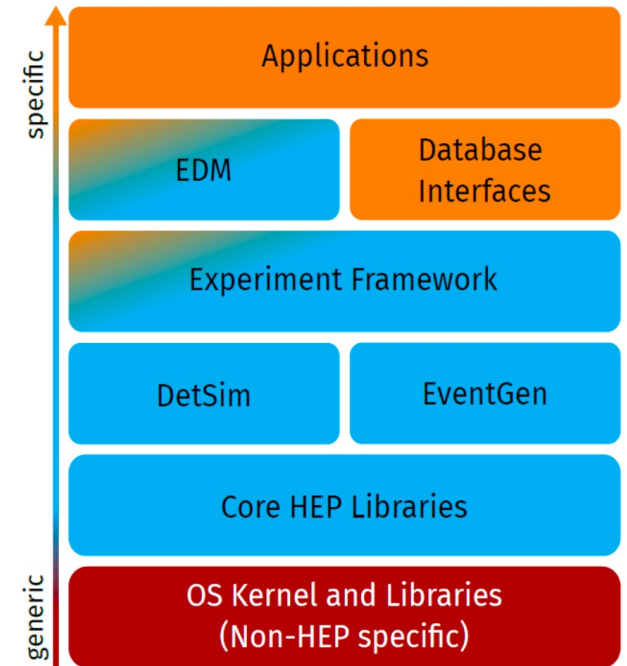
Introduction

- ❖ The CEPC software development first started with the iLCSoft
 - Reused most software modules: Marlin, LCIO, MokkaC, Gear
 - Developed its own software components for simulation and reconstruction
 - Massive M.C. data produced for detector and physics potential studies
 - CDR was released in Nov, 2018, based on results from the iLCSoft
- ❖ A new CEPC software (CEPCSW) prototype was proposed at the Oxford workshop in April 2019
- ❖ The consensus among CEPC, CLIC, FCC, ILC and other future experiments was reached at the Bologna workshop in June 2019
 - Develop a Common Turnkey Software Stack (Key4hep) for future collider experiments
 - Maximize the sharing of software components among different experiments
- ❖ Further discussion on development of Key4hep at the 'Future Software Implementations' session of the IAS program in Jan. 2020

Key4hep

❖ HEP software usually consist of lots of applications

- **Application layer** of modules/algorithms /processors performing physics task (*PandoraPFA, FastJet, ACTS,...*)
- **Data** access and representation **layer** including EDM
- Experiment **core orchestration layer** (*Gaudi, Marlin, ...*)
- **Specific components** reused by many experiments (*DD4hep, Delphes, Pythia,...*)
- Commonly used **HEP core libraries** (*ROOT, Geant4, CLHEP, ...*)
- Commonly used **tools and libraries** (*Python, CMake, boost,...*)



Thomas Madlener,
Epiphany Conference 2021

- ❖ CEPCSW is being fully integrated with Key4hep to share software with other future experiments
- ❖ IHEP and SDU are also involved in Key4hep development as non-EU members

Overview of CEPCSW

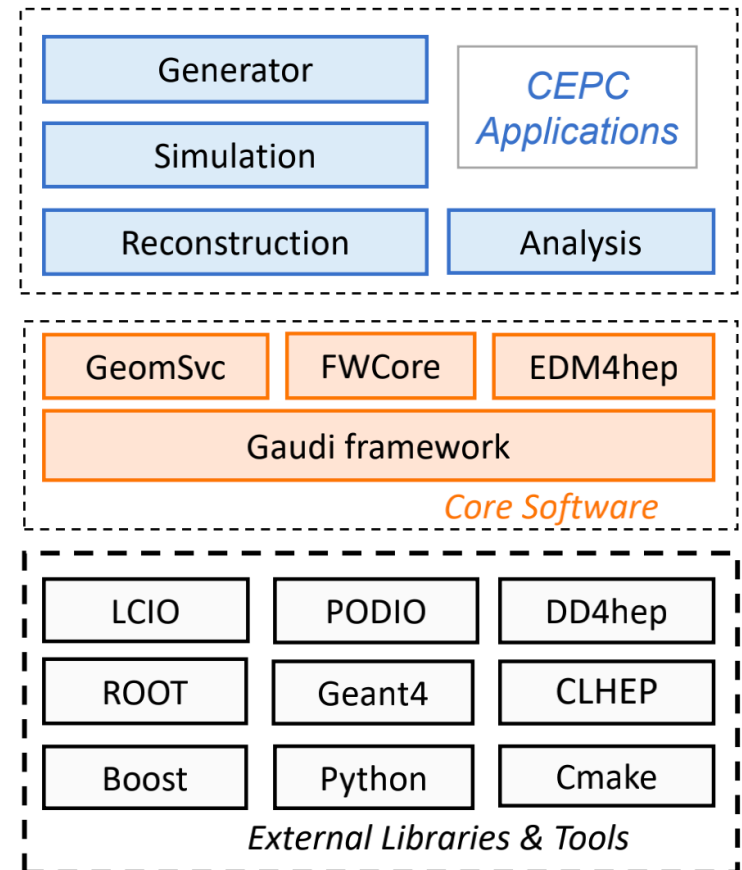
❖ CEPCSW software structure

- Core software
- Applications: simulation, reconstruction and analysis (see talks given by Weidong and Shengshen)
- External libraries

❖ Core software

- Gaudi/Gaudi Hive: defines interfaces to all software components and controls their execution.
- EDM4hep: generic event data model
- K4FWCore: manages the event data
- DD4hep: geometry description
- CEPC-specific framework software: generator, Geant4 simulation, beam background mixing, fast simulation, machine learning interface, etc.

<https://github.com/cepc/CEPCSW>

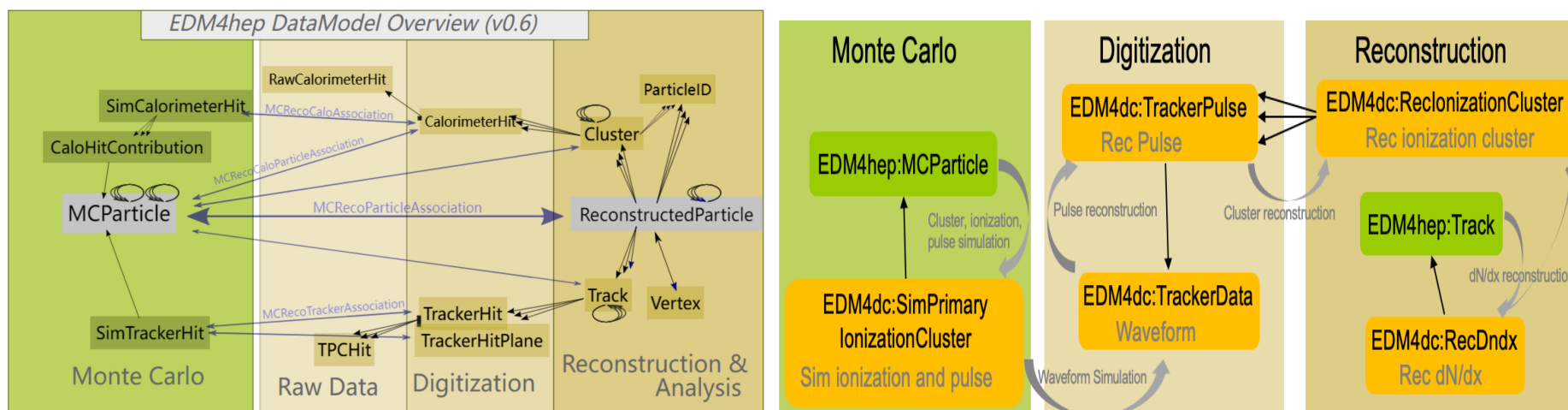


Status of CEPCSW

- ❖ CEPCSW is under rapid development, and its latest version is v0.2.6
 - Well supported detector simulation and reconstruction studies on the 4th conceptual detector
- ❖ Lots of progress has been made on core software of CEPCSW since last IAS meeting
 - Optimizations on key components according to application requirements
 - Event Data Model
 - Detector Description
 - Simulation Framework
 - Developments on adopting new technologies to boost CEPCSW performance
 - Multi-threaded Detector simulation
 - Heterogeneous Computing
 - Machine Learning Integration based on ONNX
 - Analysis framework based on RDataframe
 - Automated Validation System

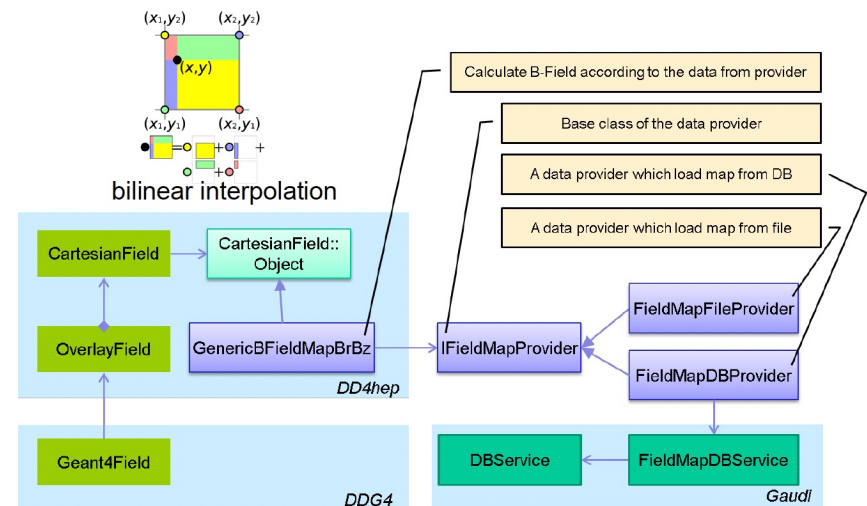
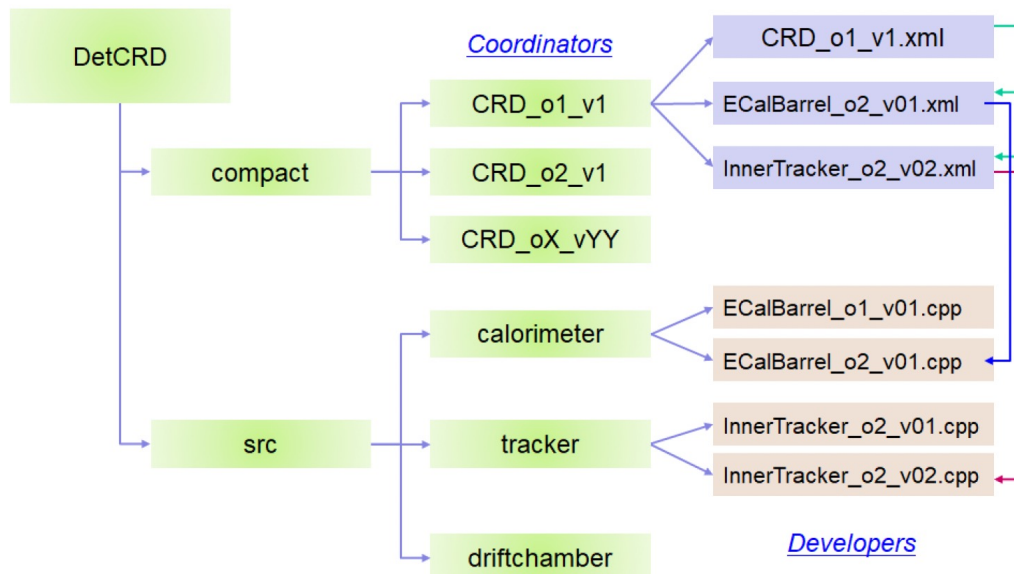
Event Data Model

- ❖ EDM of CEPCSW is adopted from EDM4hep
 - In different data processing stages
 - For different sub-detectors
- ❖ Extension of EDM4hep is developed to accommodate the drift chamber dN/dx study
 - Also can be used for TPC detector
 - Will be merged into EDM4hep soon ([PR](#))



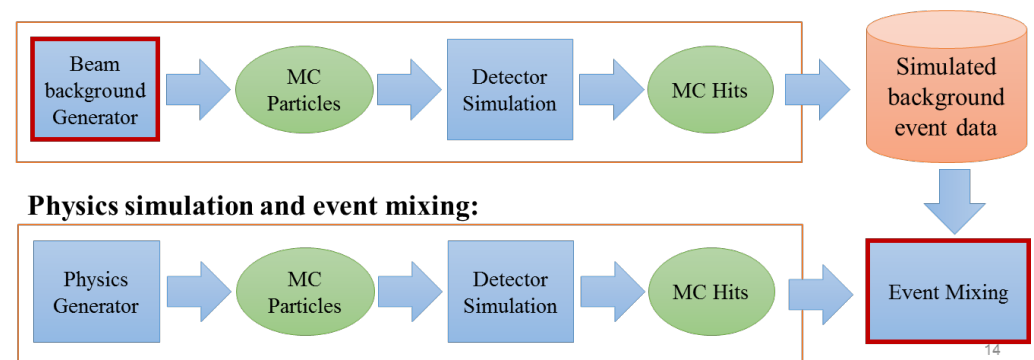
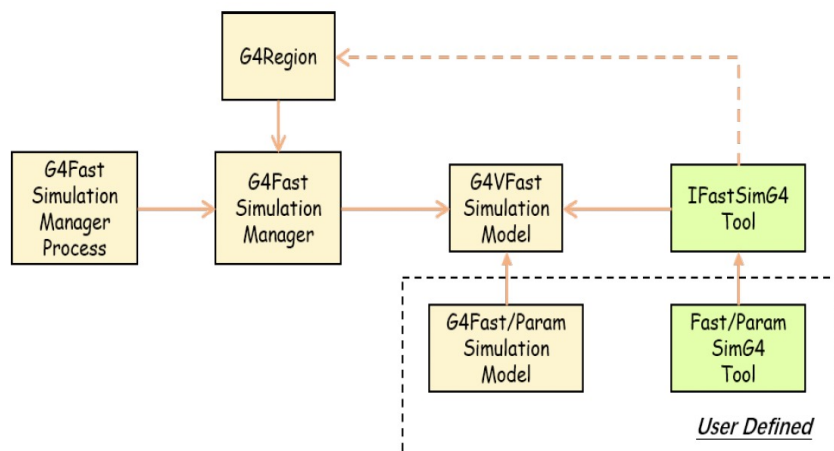
Detector Description

- ❖ DD4hep is adopted to provide a full detector description with a single source of information
- ❖ Different detector design options are managed in git repository and easily to be changed in CEPCSW
- ❖ The non-uniform magnetic field has also been implemented in CEPCSW



Detector Simulation

- ❖ The Geant4-based full detector simulation framework has been developed in CEPCSW and supported sub-detectors simulations and their performances study
 - including silicon detectors, time projection chamber, drift chamber and calorimeters.
- ❖ The region-based fast simulation interface is also developed to integrate different fast simulation models into Geant4.
- ❖ CEPCSW provides an unified solution for different backgrounds' simulation and event mixing at the hit level



Gaussino: a new experiment-independent simulation framework

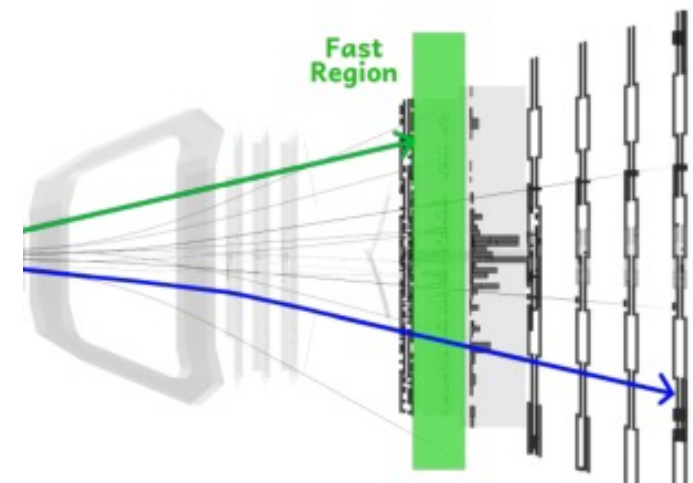
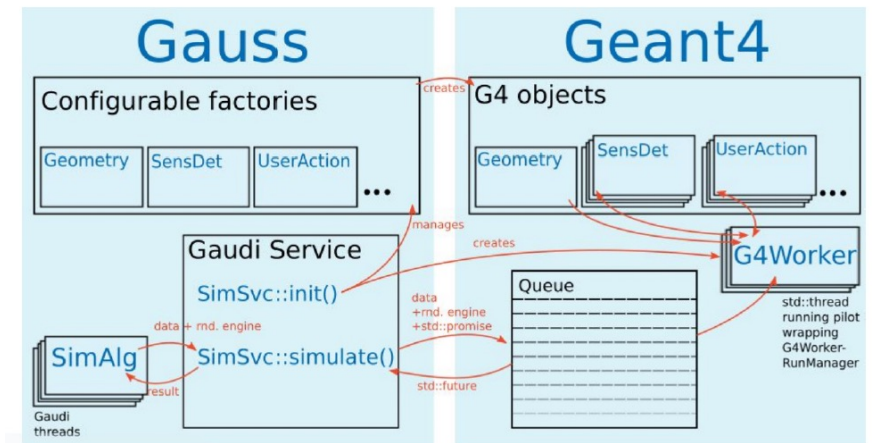
❖ Developed based on the LHCb simulation framework (Gauss)

- Well Integrated multi-threaded functions of Gaudi and Geant4
- Achieved good scalability

❖ Key Features:

- Multi-threaded interfaces to Event generator (Pythia8) and detector simulation (Geant4MT)
 - Supports parallel execution of multiple events at the same time as well as for parallelism within a single event.
- Dedicated fast simulation Interface to invoke fast simulations for a given detector

Ref: [See Talk given by Michał Mazurek, Gauss and Gaussino, ICHEP 2022](#)



CEPC detector simulation based on Gaussino

❖ Application of Gaussino to CEPC detector simulation is under going

- Idea: reuse the existing code and use Gaussino as a black box.
- Challenge: how to integrate the existing CEPC detector geometry.

- Two possible methods:

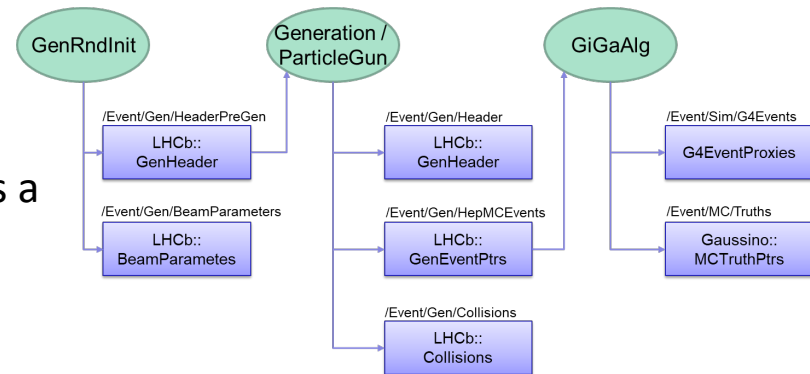
- Method 1:

- DD4hepDetectorConstructionFAC decides which object will be created for detector construction
 - DD4hepDetectorConstruction is responsible to construct CEPC detector with DD4hep

- Method 2:

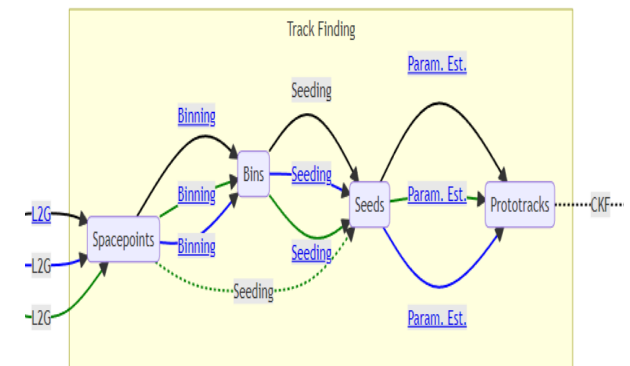
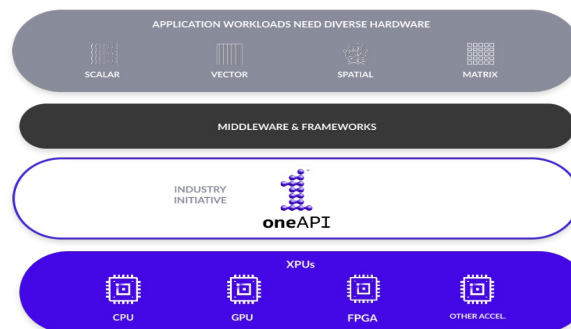
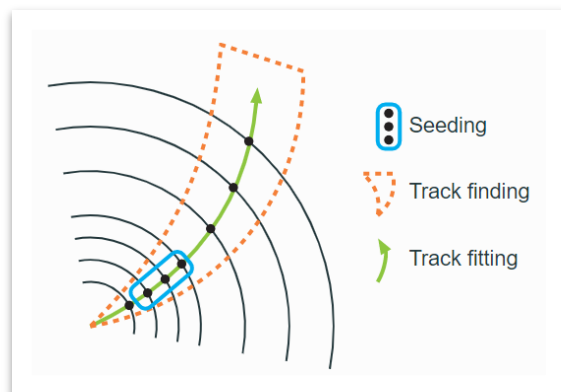
- GiGaMTDetectorConstructionFAC creates geometry by invoking GeoSvc
 - DD4hepCnvSvc will be used to create geometry with DD4hep

- A prototype for CEPC detector simulation with the method 1 is under developing



Heterogeneous Computing

- ❖ Utilizing heterogeneous resource is one of possible ways to cope with the increasing HEP data processing/analysis.
- ❖ Lots of efforts has been devoted on heterogeneous computing, for example
 - TRACCC is a project below ACTS to demonstrate tracking chain on different kinds of computing hardware (CPU/GPU/FPGA).
- ❖ The strategies:
 - SYCL enables the definition of data parallel functions by providing required APIs and runtime libraries
 - OneAPI can provide a unified programming model and enables code reuse across heterogeneous devices (CPU/GPU/FPGA)



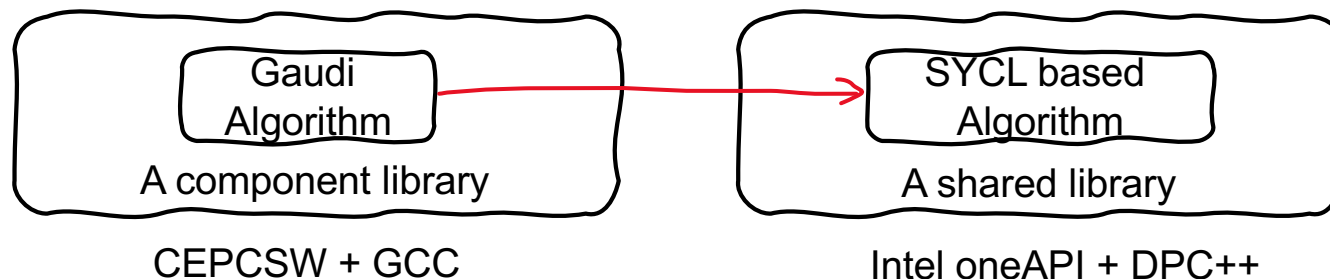
Heterogeneous Computing

❖ Activities in CEPCSW

- We are able to run TRACCC in a standalone environment and managed to build/run TRACCC on both CPU/GPU.

Config	Hardware	OS	Compiler	SYCL backend	Bulid tracc	Run tracc
1	Intel CPU (IHEP login node)	CentOS 7.8	LCG 101 (GCC 10.3 + clang 12) + oneAPI DPC++	CPU	OK	OK
2	Intel CPU + NVIDIA RTX 8000 (workstation)	CentOS 7.9	LCG 101 (GCC 11.1) + intel/llvm (2021-12)	CUDA 11.2	OK	OK

- Now the TRACCC seeding algorithm has been integrated within CEPCSW by developing middleware between Gaudi algorithm and SYCL based algorithm.



Machine Learning Integration

- ❖ Machine Learning becomes more and more important in HEP data processing
 - Different tasks may use different Machine learning libraries and produce different models
 - We need an unified way to integrate different models in CEPCSW and run inference easily
- ❖ ONNX is an open format built to represent machine learning models.
 - Support to convert from other models to ONNX, such as Tensorflow, PyTorch etc.
 - Easy to run inference on different platforms, such as ONNX Runtime, ONNX MLIR etc.
 - Some applications of ONNX in HEP
 - Fast simulation in Geant4 using ONNX inference interface [1]
 - Fast Inference for Machine Learning in ROOT TMVA [2]
- ❖ ONNX Runtime is a cross-platform inference and training accelerator
 - Accelerate inference on different hardware platform (CPUs/GPU/FPGA)

[1] [Anna Zaborowska *et al.*, Fast Simulation : from Classical to Machine Learning Models](#)

[2] [Sitong An *et al.*, Fast Inference for Machine Learning in ROOT/TMVA](#)

Machine Learning Integration

- ❖ ONNX/ONNX Runtime have been integrated with CEPCSW
- ❖ Provided an example, OrtInferenceAlg,
 - In initialize()
 - Create a session object of ONNX runtime
 - Load and run an ONNX model
 - In execute()
 - Compute output for an input data

```
Ort::MemoryInfo info("Cpu", OrtDeviceAllocator, 0, OrtMemTypeDefault);

auto input_tensor = Ort::Value::CreateTensor(info,
                                             inputs.data(),
                                             inputs.size(),
                                             dims.data(),
                                             dims.size());

std::vector<Ort::Value> input_tensors;
input_tensors.push_back(std::move(input_tensor));

auto output_tensors = m_session->Run(Ort::RunOptions{ nullptr },
                                     m_input_node_names.data(),
                                     input_tensors.data(),
                                     input_tensors.size(),
                                     m_output_node_names.data(),
                                     m_output_node_names.size());

for (int i = 0; i < output_tensors.size(); ++i) {
    LogInfo << "[" << i << "]"
            << " output name: " << m_output_node_names[i]
            << " results (first 10 elements): "
            << std::endl;
    const auto& output_tensor = output_tensors[i];
    const float* v_output = output_tensor.GetTensorData<float>();

    for (int j = 0; j < 10; ++j) {
        LogInfo << "[" << i << "]" << "[" << j << "]"
                << v_output[j]
                << std::endl;
    }
}
```

```
bool OrtInferenceAlg::initialize() {

    m_env = std::make_shared<Ort::Env>(ORT_LOGGING_LEVEL_WARNING, "ENV");
    m_session_options = std::make_shared<Ort::SessionOptions>();
    m_session_options->SetIntraOpNumThreads(m_intra_op_nthreads);
    m_session_options->SetInterOpNumThreads(m_inter_op_nthreads);

    m_session = std::make_shared<Ort::Session>(*m_env, m_model_file.c_str(), *m_session_options);
}
```

Analysis toolkit based on RDataFrame

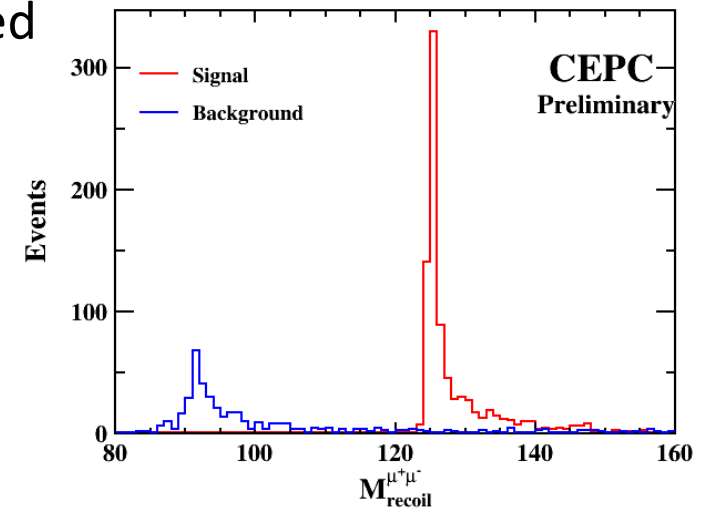
- ❖ Developing a new toolkit based on new technologies of software and hardware is very crucial to rapidly analyze drastically increasing data
- ❖ RDataFrame provides powerful and flexible way analyzing data
 - Support declarative programming and parallel workflow
 - Support analysis in both Python and C++
 - Already support reading EDM4hep root files
 - Actively used by FCC-ee for flavour, higgs and top physics
- ❖ Development of analysis tool for CEPC
 - Large data samples have been produced with Marlin for CDR in LCIO format
 - Use K4LCIOReader to generate EDM4hep data from LCIO data
 - Developed common components (functions) for analyzing EDM4hep data
 - Analysis functions in C++: event selection, filtering, producing ROOT n-tuples, etc.
 - Python for configuration: define analysis functions, input samples, output variables, etc.

Analysis toolkit based on RDataFrame

- ❖ Started with Higgs recoil analysis in $e^+e^- \rightarrow Z H$ and $Z \rightarrow \mu\mu$
 - Basic functionalities are tested: same results obtained from Marlin and RDataFrame
 - Multi-threading Performance testing shows that RDataFrame has good scalability

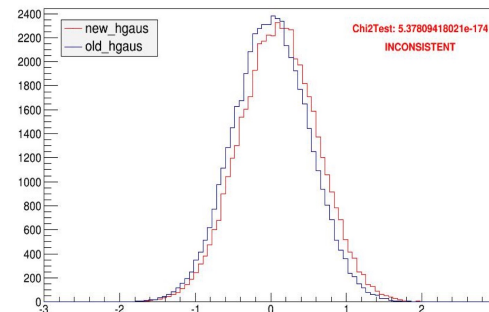
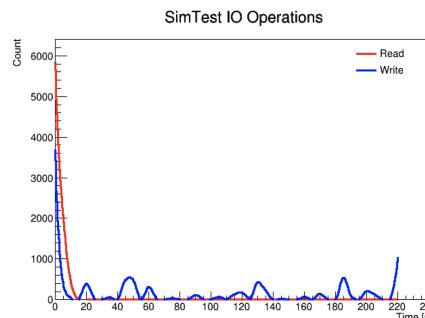
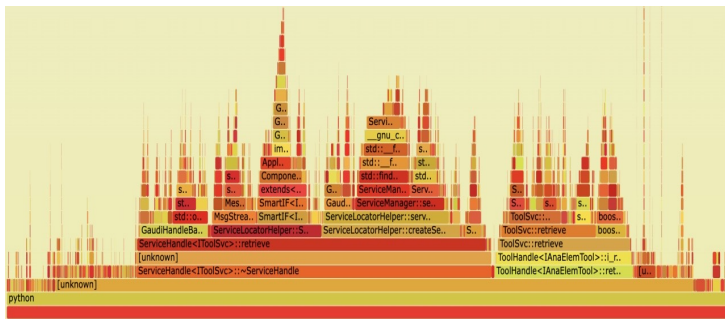
- ❖ Key analysis functions are being implemented

- PID
- Kinematic fitting
- Vertexing



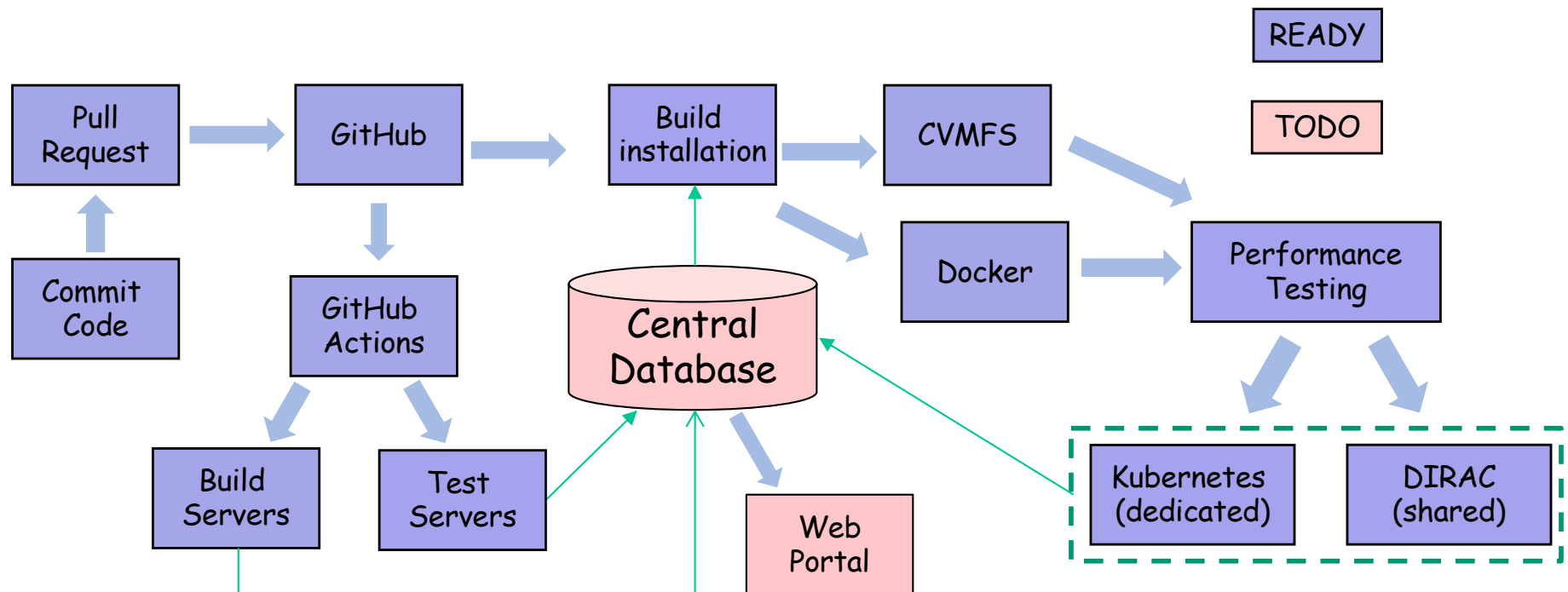
Automated Validation System

- ❖ An automated validation system is developed for software validation at different levels
 - Unit test, integrated test, performance profiling, physical validation etc.
- ❖ A toolkit is developed for building software validation workflow
 - Provide interfaces to define and run unit tests
 - Provide toolkit for performance profiling
 - Support results validation based on statistical methods
- ❖ Automated physical validation system based on massive data production (run via DIRAC resource) is being developed



Automated Validation System

- ❖ The validation system is integrated with the Github Action system
 - Full validation workflow can be triggered by commit/merge-request
 - A web-based monitoring dashboard is also being developed
- ❖ ~ O(200) cores are now available for running validation jobs



Summary

- ❖ CEPCSW is being developed in collaboration with the Key4hep project
- ❖ Key components of the CEPCSW core software are in place and keeps optimized to well support detector simulation and reconstruction studies
- ❖ Lots of efforts are devoted to adopt new technologies to boost CEPCSW performance
 - Multi-threaded Detector simulation based on Gaussino
 - Heterogeneous computing
 - Integration of Machine Learning
 - Parallel Analysis framework based RDataFrame
 - Automated validation system

Thanks for your attention!

Welcomed to joining CEPCSW and working together!

<https://github.com/cepc/cepcsw>