









cooperations



CERN CERN

A. Salzburger (CERN) for the ACTS project





### ACTS Developers Workshop

7-10 Nov 2023

Europe/Zurich timezone

Overview

Timetable

Registration

Participant List

Travel to IJCLab Orsay



The fourth ACTS developers workshop will take place at IJCLab (Orsay, France) from the 7/11 through 10/11, following Berkeley (2019), DESY/Virtual (2020) and CERN (2022)

https://indico.cern.ch/event/1295479/

Enter your search term

#### Q

### Development and R&D



acts-developers@cern.ch

CPU multi-threaded library of tracking reconstruction components



acts-parallelization@cern.ch

CPU/GPU "single source" demonstrator re-implementing the main Core chain

### Core

# R&D2

acts-machinelearning@cern.ch

Machine learning and ML assisted modules for track reconstruction

З

# <u>acts-developers@cern.ch</u>

# CPU multi-threaded library of tracking reconstruction components



### Core





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# Core: the flagship project

### Main target & language

- x86/ARM64 multithreaded architectures, GPU development moved to R&D1 line
- C++17 standard (we started first steps to move to C++20)
- minimal core dependencies: CMake, Eigen, BOOST + optional Plugins

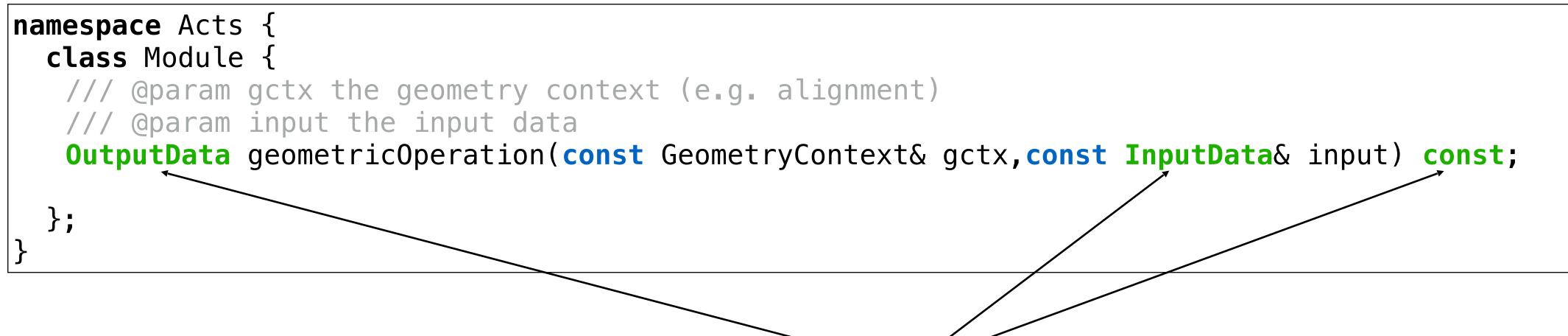
### <u>Component</u> library structure

- track & vertex reconstruction components that allow for assembling of a track reconstruction applications for different experimental setups
- designed to be integrated into an experiment software that provides scheduling, configuration, IO, conditions data, etc.

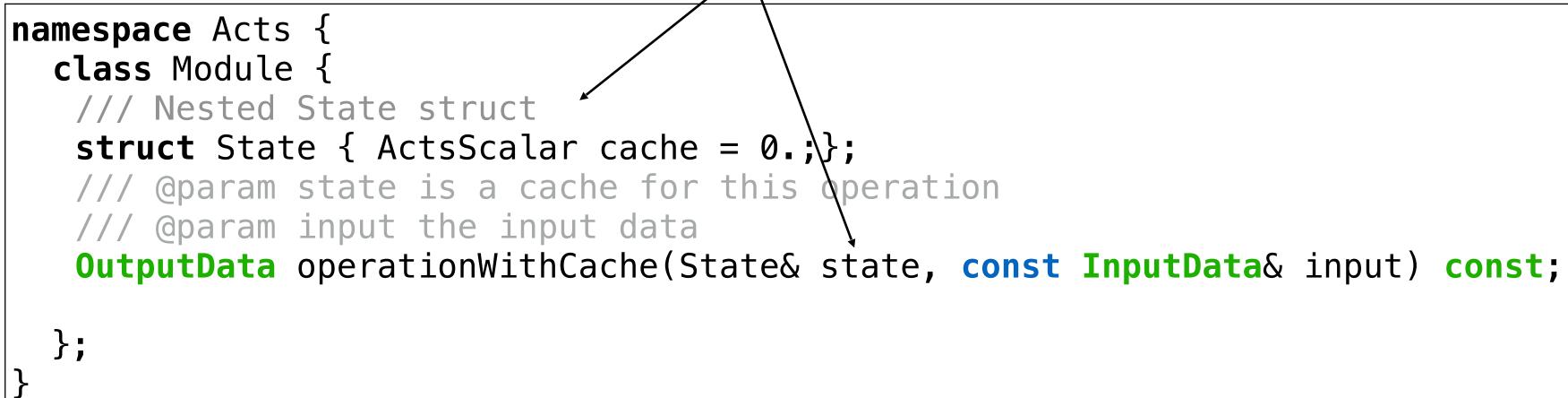
5

### Core concepts: multi threading and contextuatlity

### Built-in parallelisation support



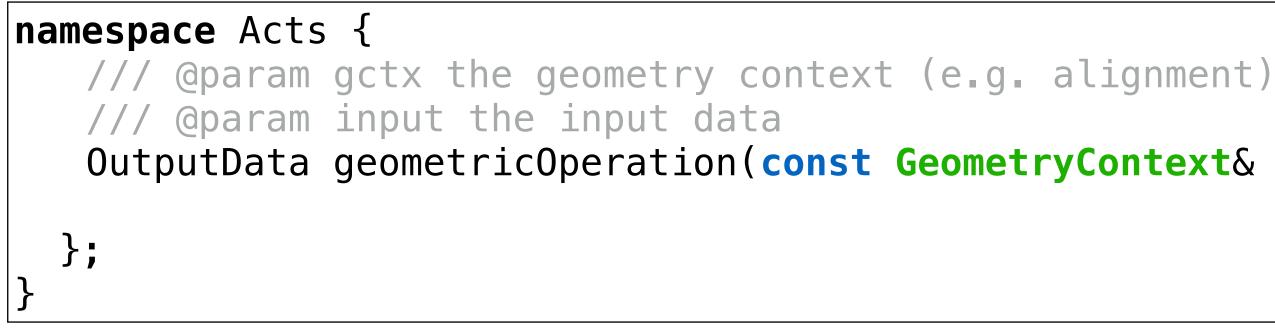
Allows parallel execution of this operation (without explicit technology binding, such as tbb) within and across events, nested **State** structs are used for necessary caching operations





### Core concepts: multi threading and contextuatlity

### Built-in parallelisation support and <u>contextuality</u>



using GeometryContext = std::any;

ACTS allows you to pack your own contextual data into the context objects (geometry, magnetic, field) and will carry it through the code base (untouched)

auto Experiment::applyCorrection(const GeometryContext& gctx, const InputData& input) const {

const Experiment::Payload& payload = std::any\_cast<const Experiment::Payload&>(gctx);

OutputData geometricOperation(const GeometryContext& gctx,const InputData& input) const;

7

# Core concepts: data driven, configuration & options

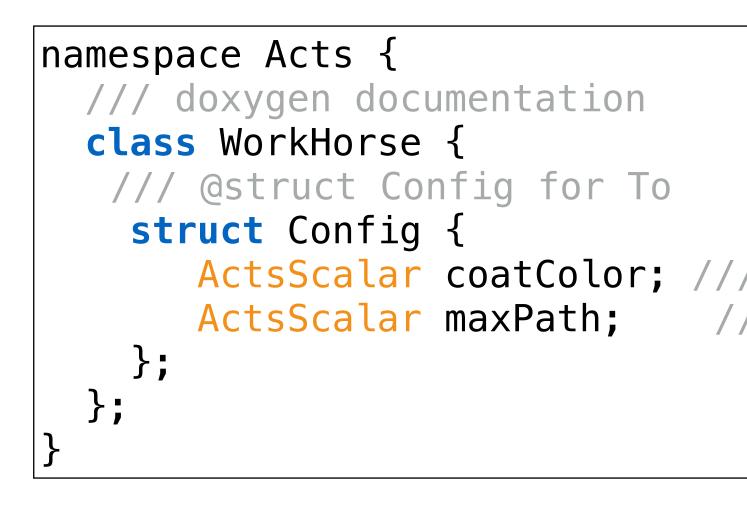
### Design convention for data driven design, configuration and option

```
namespace Acts {
  /// doxygen documentation
  class Module {
  /// @struct Config for this module,
    struct Config {
       ActsScalar globalParameter; ///< configure this module
  };
   /// @struct Options for this module, changeable on call
    struct Options {
       ActsScalar callParameter; ///< how the horse feels today
  };
   /// @param cfg the configuration struct for this module
   Module(const Config& cfg) : m_config(cfg){};
   /// @param input the input data
   OutputData operation(const InputData& input, const Options& opt) const;
  };
```

8

Core concepts: configuration binding

### Simple Config structs on ACTS side



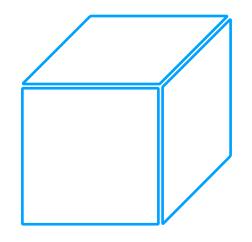
Connection to experiment framework, e.g. Gaudi/Athena

/// feed from Framework into ACTS configuration
declareProperty("CoatColor", m\_cfg.coatColor);
declareProperty("MaxPath", m\_cfg.maxPath);

ruct Config {
 ActsScalar maxPath; ///< set the max path this horse can run</pre>



### Selected Core modules



**Geometry/Detector\*** 

(Surface based geometry)

Plugins to DD4hep, TGeo, etc.

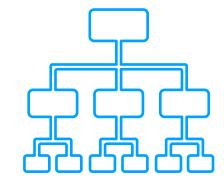
**Event Data Model** 

target track reconstruction

backend separation with different I/O models



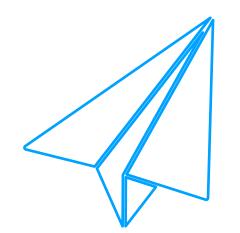
**Track Fitting** parameter estimation with Kalman Filter, GSF, GX2F\*\*



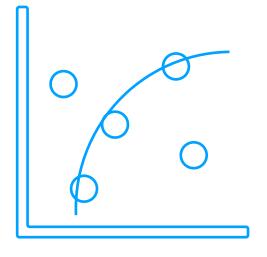
#### **Combinatorial track finding**

Combinatorial Kalman Filter for track finding

\*new geometry model to be deployed in 2023, \*\*GX2F prototype to come 2024



#### Propagation parameter + covariance transport through magnetic field



#### Seeding

Seed finding with Triplet seeder, OrthogonalSeedFinder



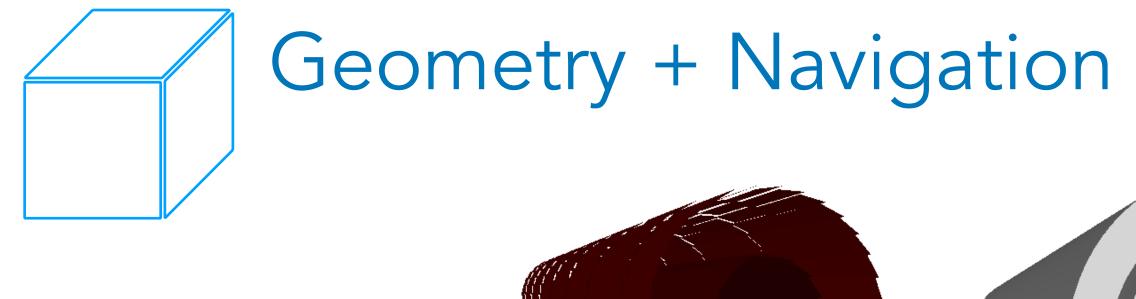
#### **Vertex finding + fitting**

Iterative, multi variant primary vertex finders and fitters

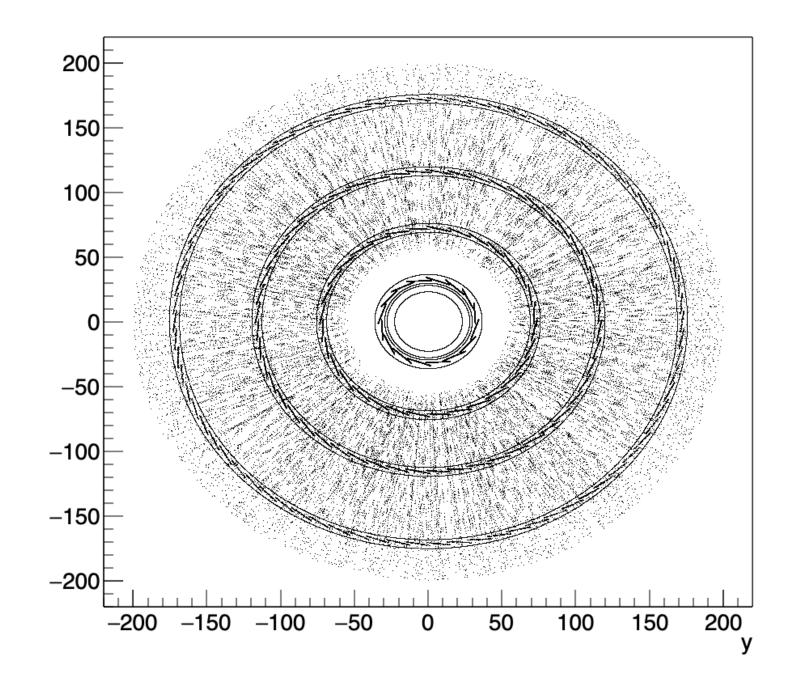


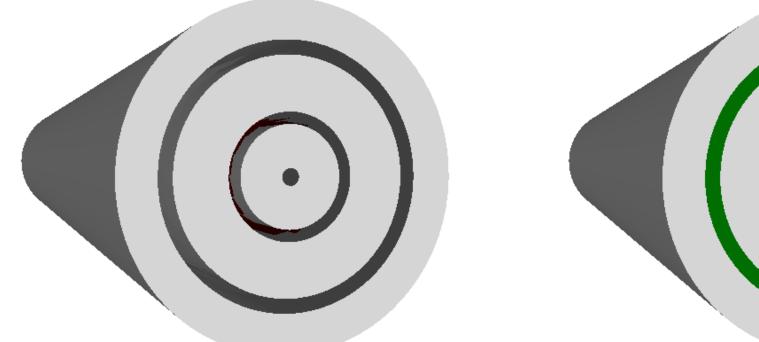
### **Detector alignment**

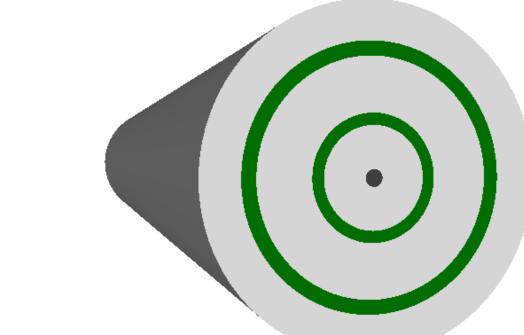
KF based alignment functionality

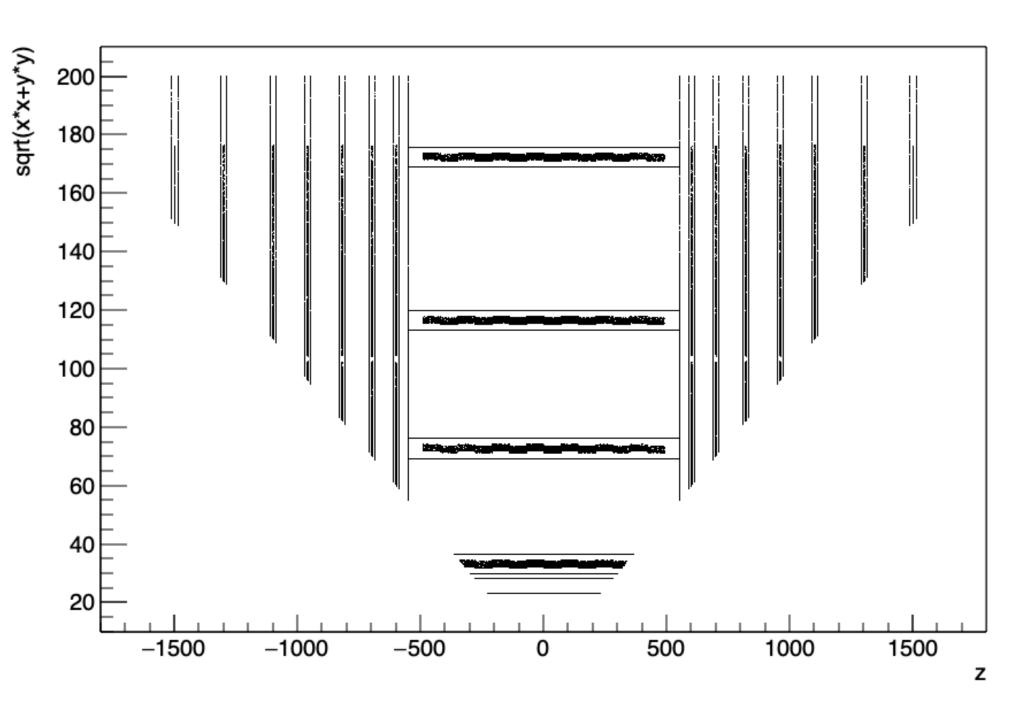


### Surface based geometry model, optimised for reconstruction, can be connected to standard HEP geometry modellers











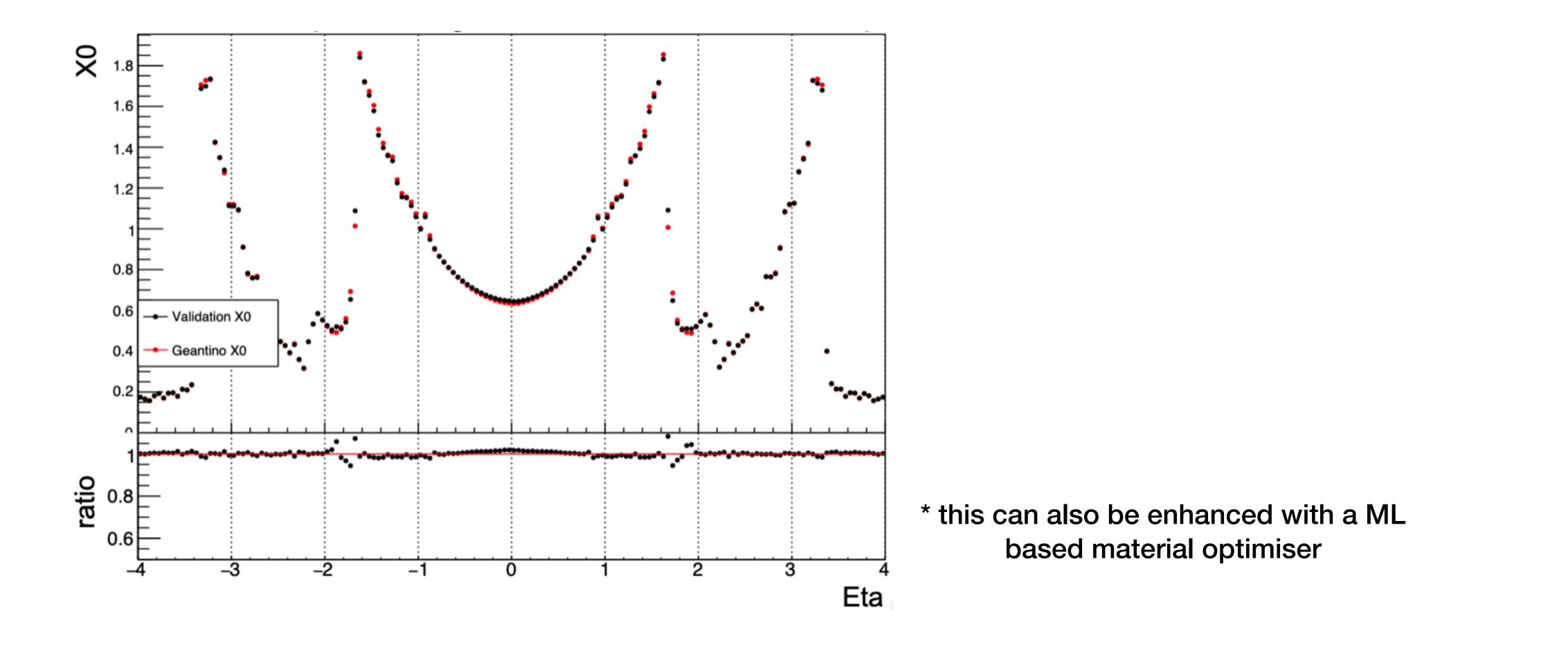


### **Detailed geometry model,** e.g. DD4hep, TGeo, GeoModel, etc.

### **ACTS** geometry model with builtin navigation

### Geometry + Material

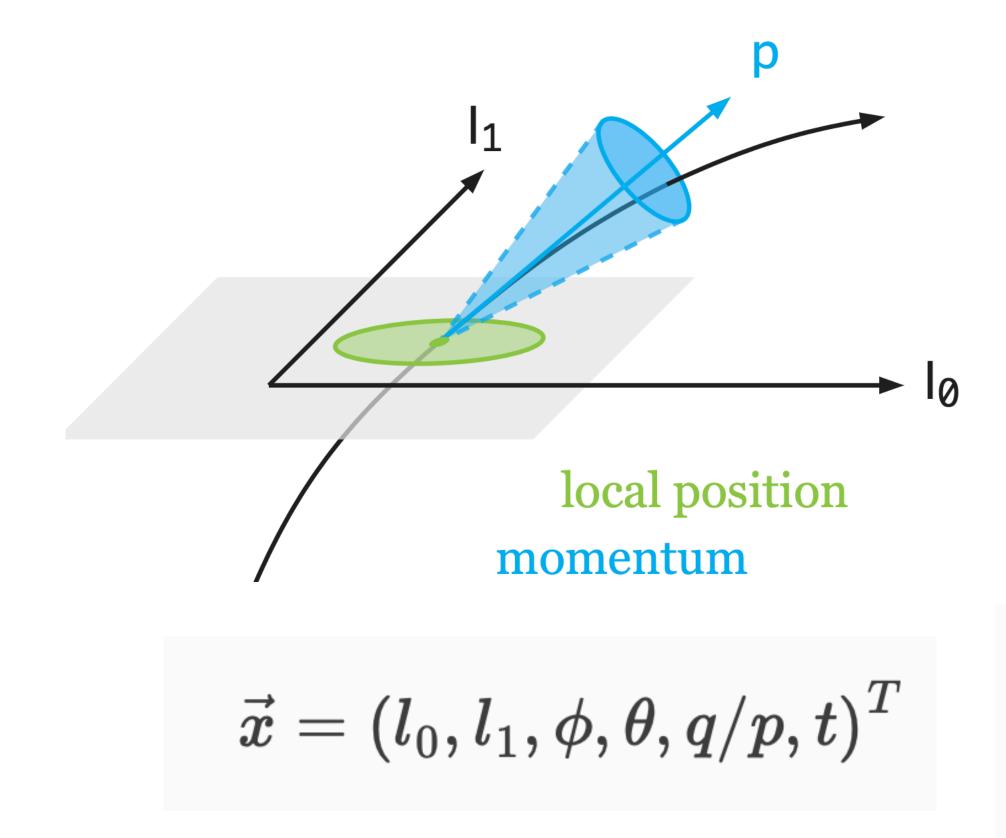
with close-to Geant4 precision

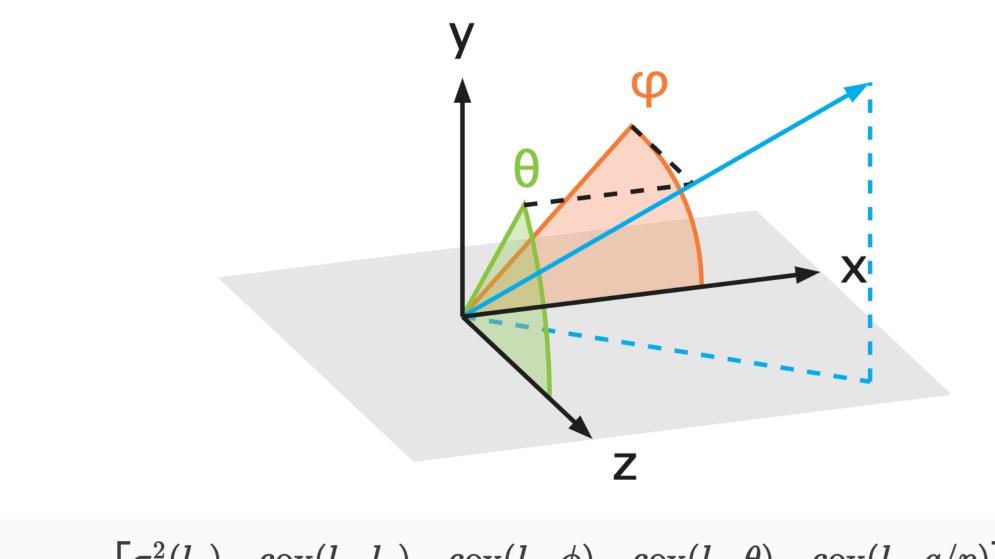


### ACTS ships with a material mapping module that allows to describe the detector material



### (Bound) track parameterisation is defined: local coordinates of the surface + global momentum





 $C = egin{bmatrix} \sigma^2(l_0) & \operatorname{cov}(l_0, l_1) & \operatorname{cov}(l_0, \phi) & \operatorname{cov}(l_0, heta) & \operatorname{cov}(l_0, q/p) \ dots & \sigma^2(l_1) & \operatorname{cov}(l_1, \phi) & \operatorname{cov}(l_1, heta) & \operatorname{cov}(l_1, q/p) \ dots & dots & \sigma^2(\phi) & \operatorname{cov}(\phi, heta) & \operatorname{cov}(\phi, q/p) \ dots & dots & dots & \sigma^2( heta) & \operatorname{cov}(\phi, q/p) \ dots & dots & dots & dots & dots & dots & \sigma^2( heta) & \operatorname{cov}(\theta, q/p) \ dots & dots$ 

# Event Data Model

#### Parameter

Bound track parameters

Pixel measurement

Pixel measurement with time

Strip measurement (along local

Strip measurement (along local

Drift time/circle measurement

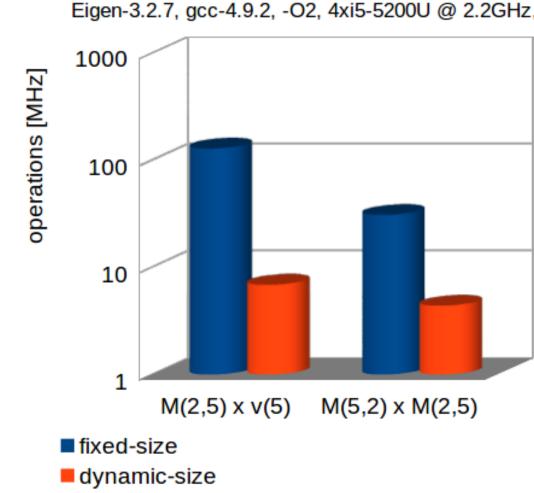
Track segment (straight line)

. . .

Measurements can be represented as subsets of the full bound parameter space.

This is done at compile time to increase computing performance.

	0	l <sub>1</sub>	phi	theta	q/p	t
x)						
y)						





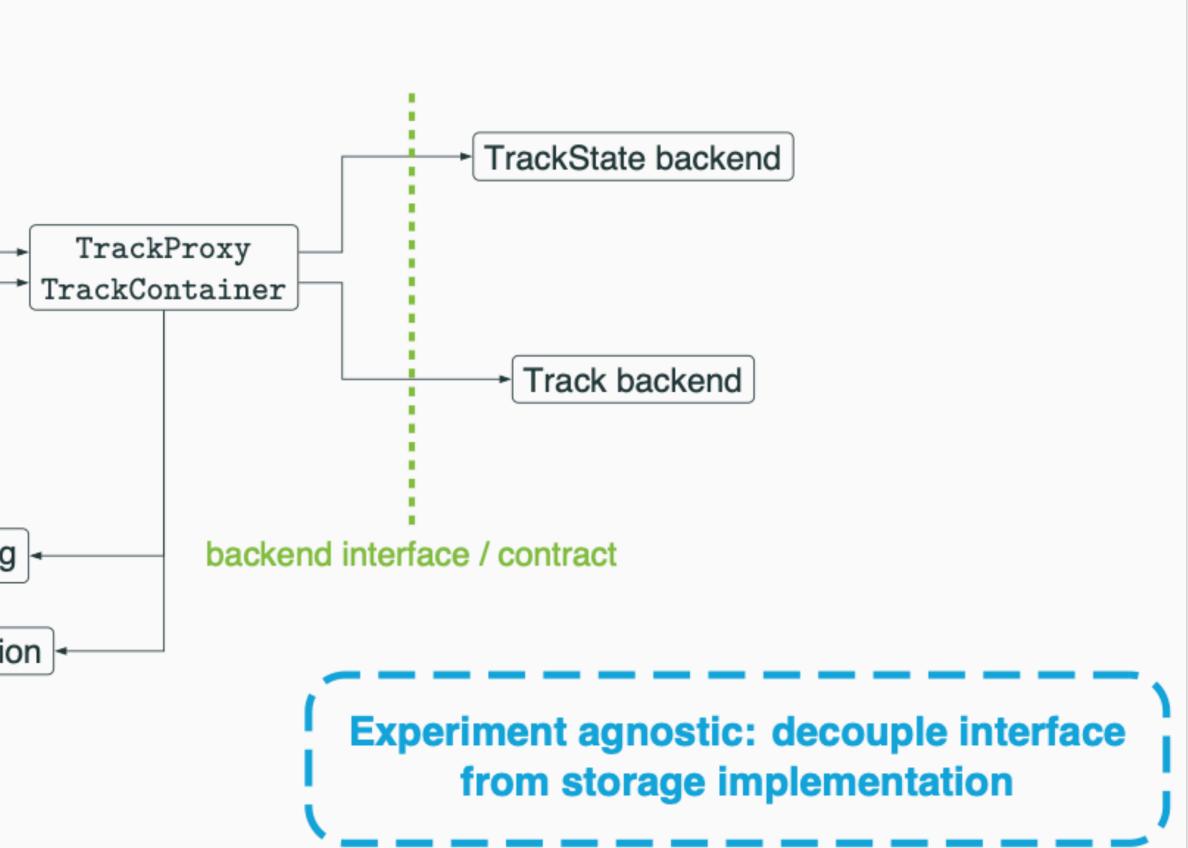
# Event Data Model + I/O backend

### ACTS has an internal EDM optimised for track reconstruction.

- recent work to separate transient model from I/O backend
- demonstrator with PODIO established
- Non-optimised EDM4Hep version also available

Architecture				
Track finding				
Track fitters				
Performance monitorir	າູ			
Downstream reconstruct	tio			

[Paul Gessinger-Befurt, CHEP2023, Parallel talk]





### Stepping loop (until max number of steps)

#### Navigator::status:

On a current surface?

#### Walk through actor list

Walk through aborter list

#### Navigator::target Next candidate surface

```
// Pre-Stepping: abort condition check
if (!state.options.abortList(result, state, m_stepper)) {
  // Pre-Stepping: target setting
 m_navigator.target(state, m_stepper);
 // Stepping loop
 ACTS_VERBOSE("Starting stepping loop.");
  terminatedNormally = false; // priming error condition
  // Propagation loop : stepping
  for (; result.steps < state.options.maxSteps; ++result.steps) {</pre>
    // Perform a propagation step - it takes the propagation state
    Result<double> res = m_stepper.step(state);
    if (res.ok()) {
     // Accumulate the path length
     double s = *res;
     result.pathLength += s;
     ACTS_VERBOSE("Step with size = " << s << " performed");</pre>
     else {
     ACTS_ERROR("Step failed with " << res.error() << ": "
                                     << res.error().message());
     // pass error to caller
     return res.error();
    // Post-stepping:
    // navigator status call - action list - aborter list - target call
    m_navigator.status(state, m_stepper);
    state.options.actionList(state, m_stepper, result);
    if (state.options.abortList(result, state, m_stepper)) {
      terminatedNormally = true;
     break;
    m_navigator.target(state, m_stepper);
 else {
 ACTS_VERBOSE("Propagation terminated without going into stepping loop.");
```

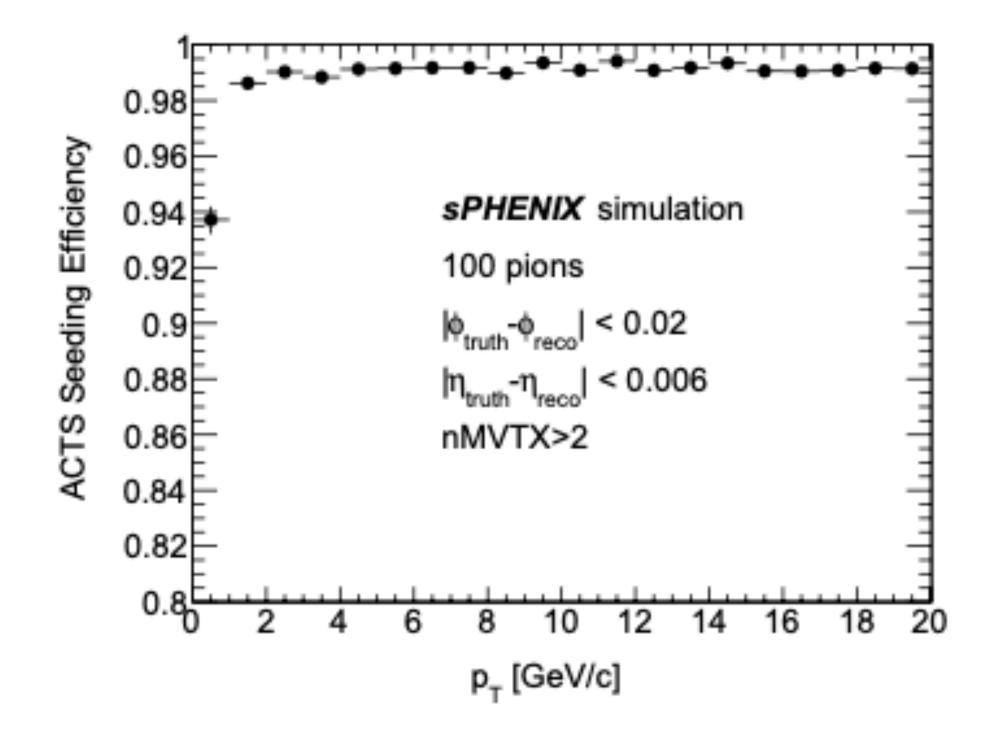




Triplet finding for initial track seeding, two alternative implementations:

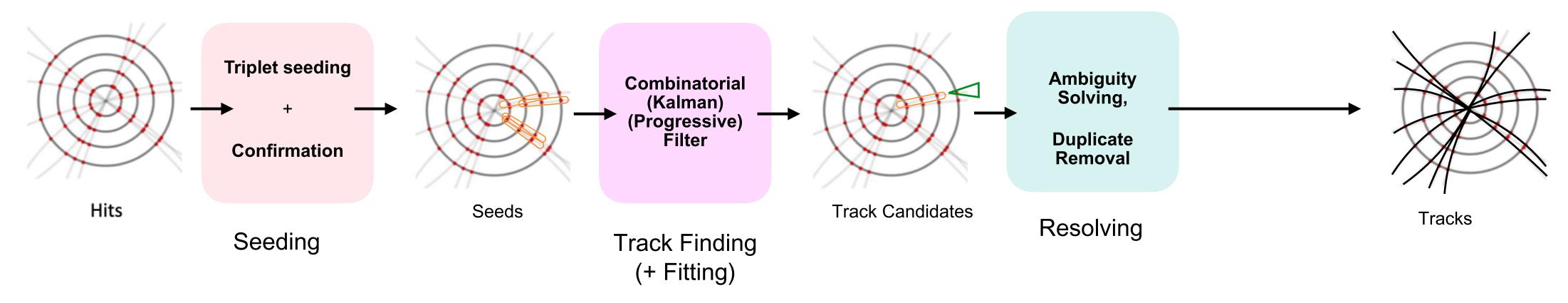
- ATLAS inspired mid-point seeding
- Orthogonal Seed finding

Output of seeding is input to the Combinatorial Track finding module.



# Full chain prototype implementation

### CKF chain

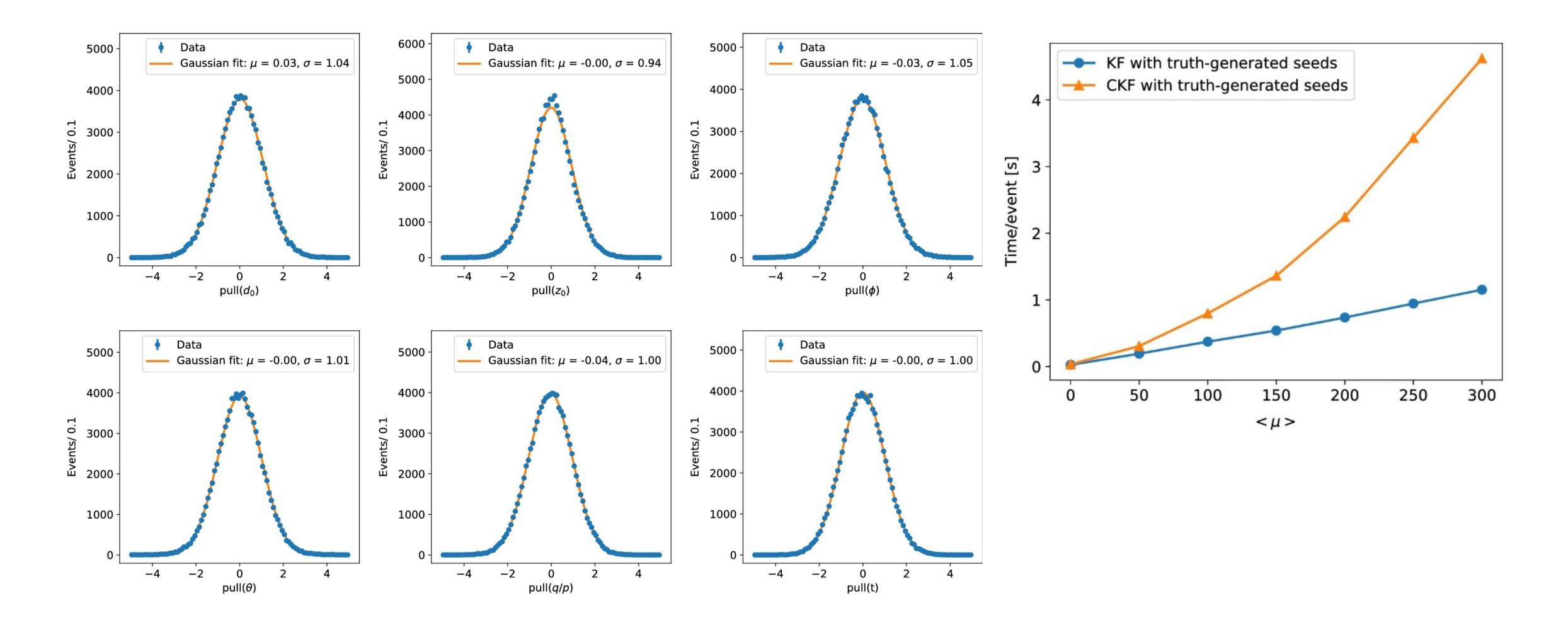


### This resembles the ATLAS track reconstruction strategy

However, this is only one possible implementation put together by ACTS tools (That's the spirit of a component library)

# Full chain - with combinatorial track finding

A first full chain documented using the Open Data Detector / TrackML detector in: https://link.springer.com/article/10.1007/s41781-021-00078-8



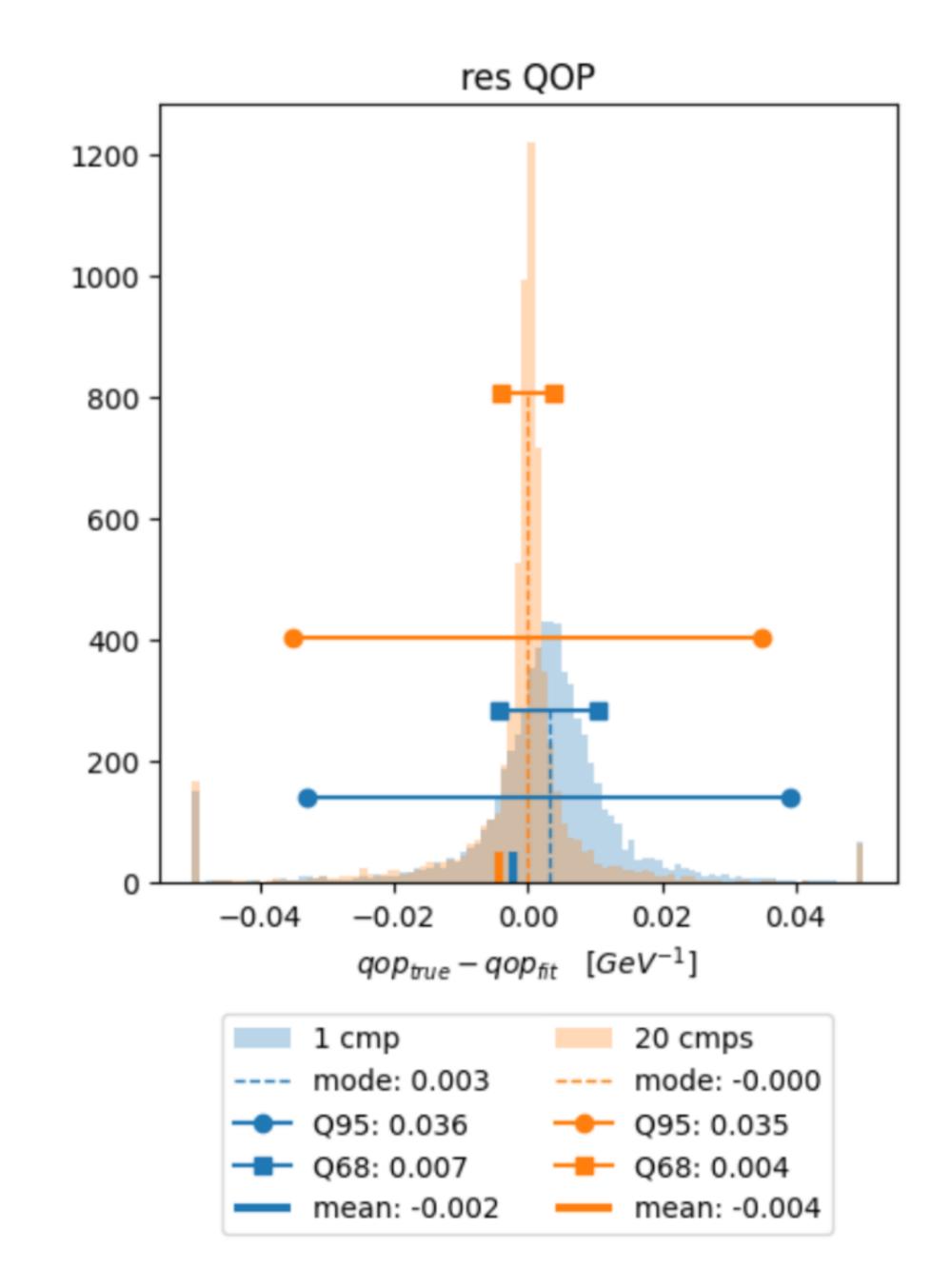
# Recently added functionality

First Gaussian Sum Filter (GSF) for electron reconstruction

The GSF is a multi-variant extension of the Kalman Filter to model non-Gaussian noise (i.e. Bremsstrahlung)

Global Chi2 Fitter currently in prototyping stage

Aim is here to have interchangeable components.



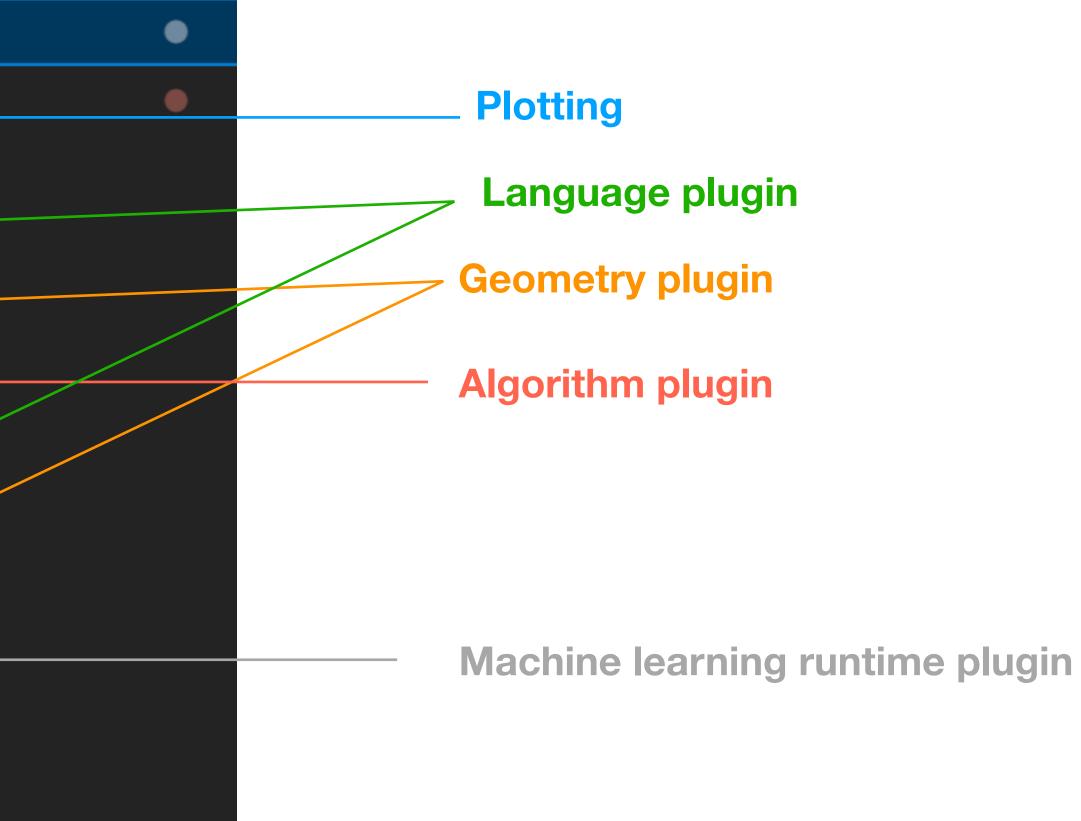
# Core: Extensability

### Plugin mechanism

- Library is extendable in functionality with several plugins
- Usually also pull in additional third party dependencies

$\sim$ Plugins	
> ActSVG	4
> Autodiff	
> Cuda	<
> DD4hep	<
> ExaTrkX 🛛 🛶	
> Identification	
> Json	
> Legacy	
> Onnx	
> Sycl	
> TGeo	

ral plugins ndencies



# Core: testing

### Comprehensive **Unit testing** is one of the main targets of our development model

- Best practise: write the code & tests together
- Small testable units/modules is key to this

### Based on BOOST unit testing framework, Codecov (as part of CI) checks covering

#### **Codecov** Report

Merging #1551 (59d52ae) into main (f3b20f7) will decrease coverage by 0.00%. The diff coverage is 0.00%.

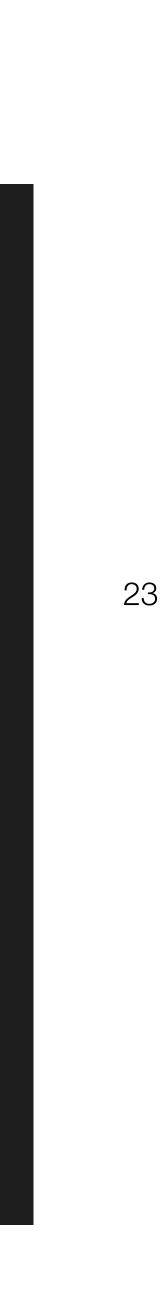
@@ ##	<b>Covera</b> main	#1551	+/-	00 ##
- Coverage	48.47%	48.46%	-0.01%	
Files	 381	 381		
Lines	20699	20702	+3	
Branches	9503	9504	+1	
				====
Hits	10034	10034		
– Misses	4112	4115	+3	
Partials	6553	6553		

```
namespace Acts {
using namespace detail;
namespace Test {
B00ST_AUT0_TEST_CASE(grid_test_1d_equidistant) {
 using Point = std::array<double, 1>;
 using indices = std::array<size_t, 1>;
  EquidistantAxis a(0.0, 4.0, 4u);
  Grid<double, EquidistantAxis> g(std::make_tuple(std::move(a)));
 // test general properties
```

```
BOOST_CHECK_EQUAL(g.size(), 6u);
BOOST_CHECK_EQUAL(g.numLocalBins().at(0), 4u);
```

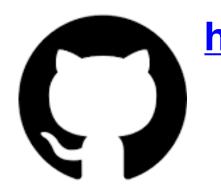
#### // global bin index

BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{-0.3}})), 0u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{-0.}})), 1u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{0.}})), 1u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{0.7}})), 1u); B00ST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{1}})), 2u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{1.2}})), 2u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{2.}})), 3u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{2.7}})), 3u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{3.}})), 4u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{3.9999}})), 4u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{4.}})), 5u); BOOST\_CHECK\_EQUAL(g.globalBinFromPosition(Point({{4.98}})), 5u);



# Core: collaboration & contributing

ACTS is Open Source and invites contributions, corrections, interactions



https://github.com/acts-project/acts

**Clone:** 

https://github.com/<username>/acts

**Develop & Make a PR** 

Make an Issue: https://github.com/acts-project/acts

Ask on mattermost: https://mattermost.web.cern.ch/acts/channels/town-square

#### **Development, Exchange with Experts, Collaboration, Code review, CI testing**

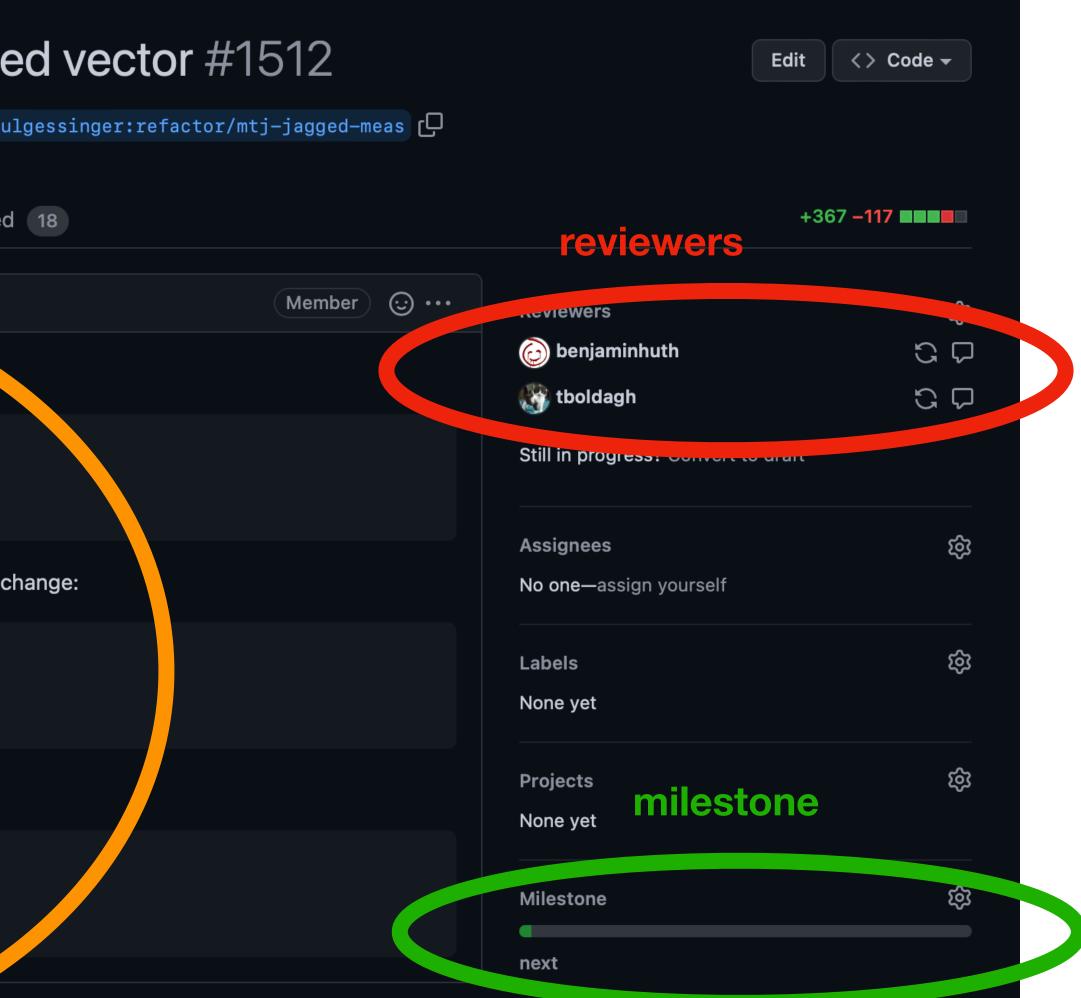
**Discuss at the open develops meeting** https://indico.cern.ch/category/7968/ Tuesday 17:00, CE(S)T



### Core: contributing

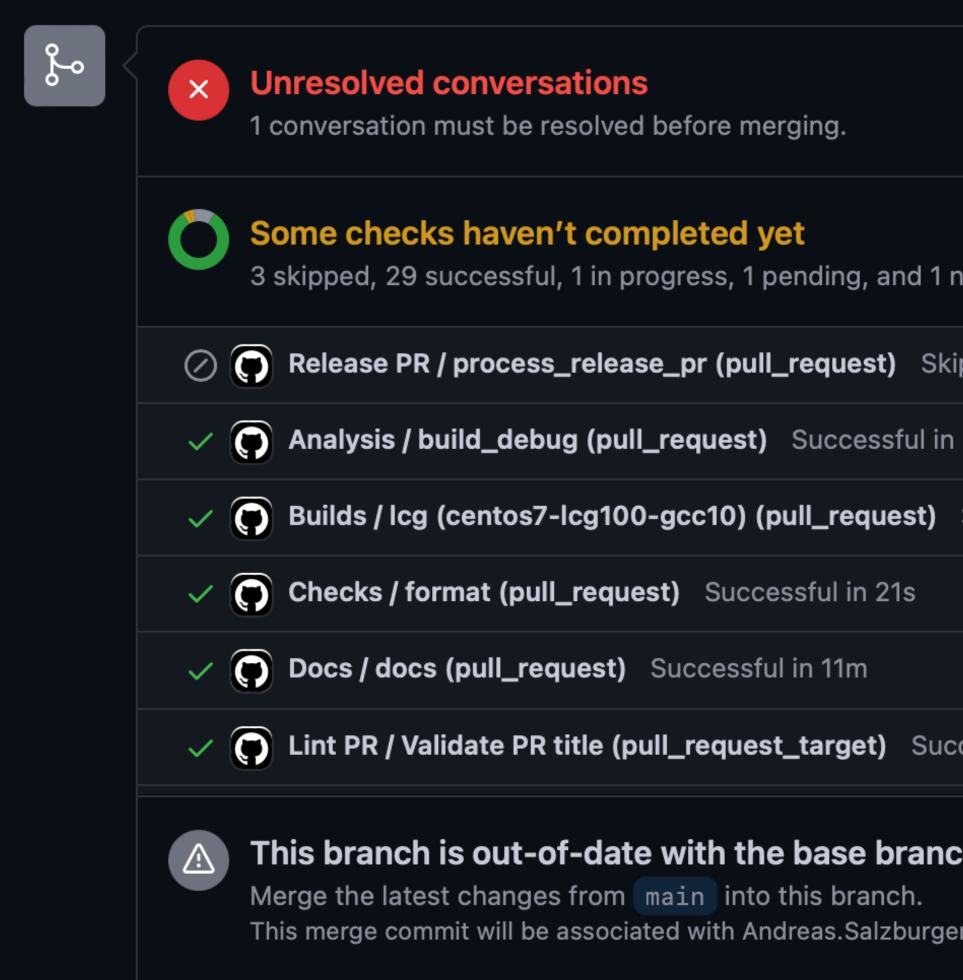
### Pull requests come with a template that guides through a proper submission semantic naming: feat, doc, refactor, fix

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refac	ctor!: MTJ	stores m	easuremer	nt as jaggo
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# Core: contributing & testing

### Pull requests run through a CI pipeline



		View
neutral checks	Hide all	checks
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	Required	Details
	Required	Details
cessful in 3s	Required	Details
h	Update branch	•
r@cern.ch.		

# Core: collaboration & community

# **Community-Supported Components: Acts**

Weekly dev meeting with involvement of users at multiple experiments

Status of work visibility through presentations

Example of agile in community software

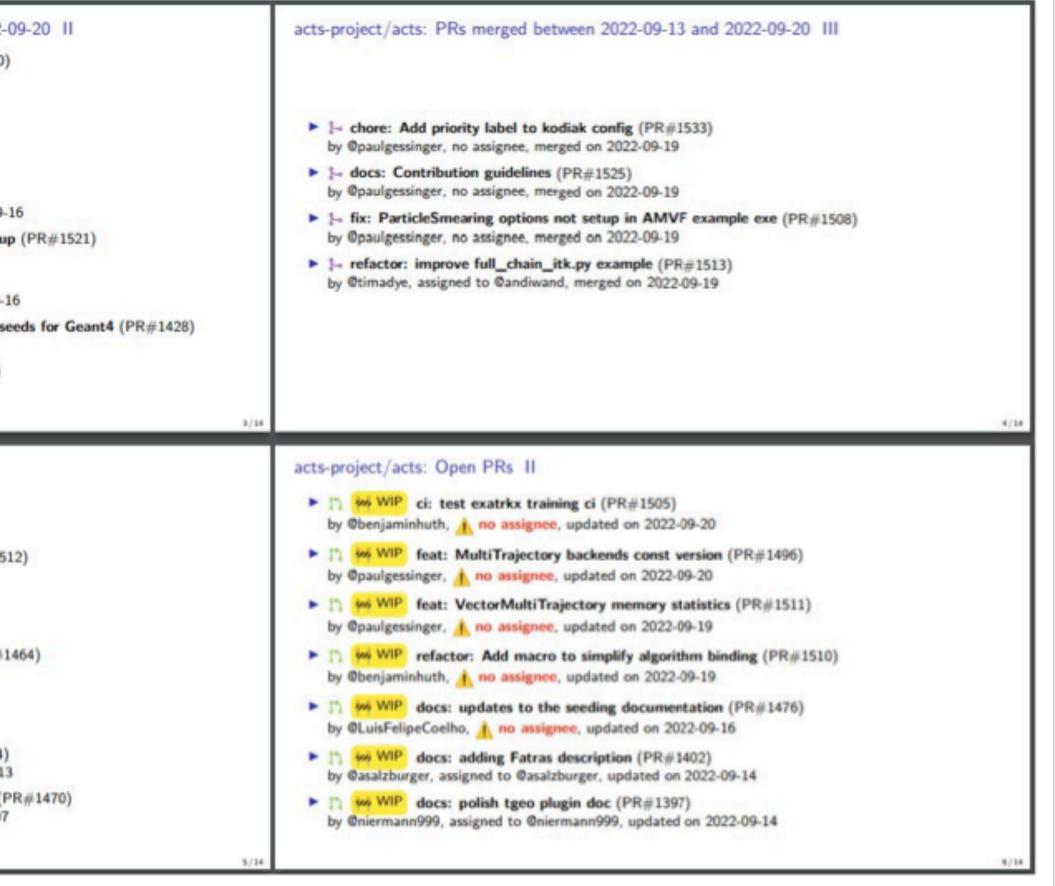
#### acts-project/acts: PRs merged between 2022-09-13 and 2022-09-20 II

- I- docs: Update logging doc, add info on thresholds (PR#1520) by @paulgessinger, no assignee, merged on 2022-09-16
- docs: update markdown cheatsheet (PR#1524) by @benjaminhuth, no assignee, merged on 2022-09-16
- feat: Exa.TrkX with torchscript backend (PR#1473) by Obenjaminhuth, no assignee, merged on 2022-09-16
- docs: Gaussian Sum Filter (PR#1403) by @benjaminhuth, assigned to @benjaminhuth, merged on 2022-09-16
- ▶ In fix: Added missing return to seedfinder::CreateSeedsForGroup (PR#1521) by @guilhermeAlmeida1, no assignee, merged on 2022-09-16
- In refactor: Improve material mapping speed (PR#1458) by @Corentin-Allaire, assigned to @asalzburger, merged on 2022-09-16
- I= feat: Allow configurable particle selection and reproducible seeds for Geant4 (PR#1428) by @benjaminhuth, no assignee, merged on 2022-09-19
- I- chore: Add priority merge label to kodiak config (PR#1532) by @paulgessinger, no assignee, merged on 2022-09-19

#### acts-project/acts: Open PRs 1

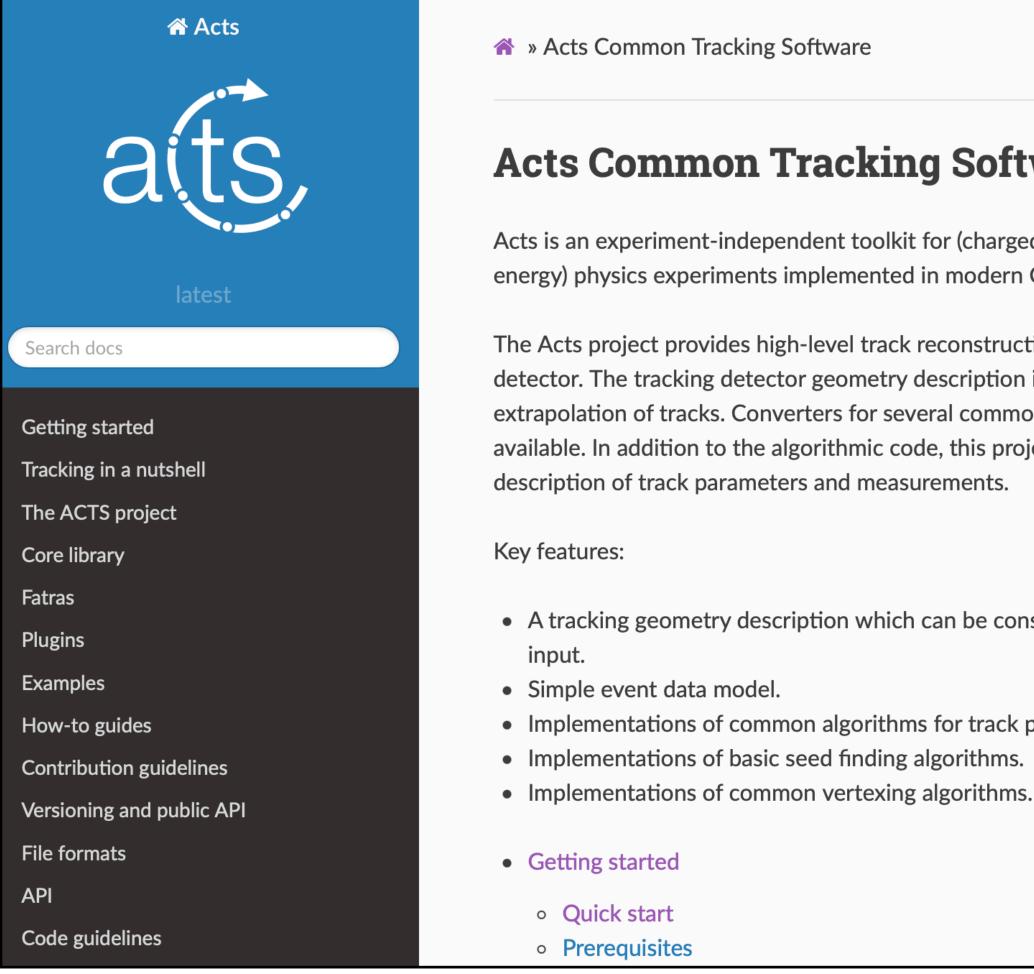
- refactor: improve full\_chain\_odd.py example (PR#1538) by @andiwand, assigned to @timadye, updated on 2022-09-20
- In refactor: MTJ stores measurement as jagged vector (PR#1512) by @paulgessinger, no assignee, updated on 2022-09-20
- In feat: Hough Transform first implementation (PR#1305) by @jahreda, A no assignee, updated on 2022-09-19
- feat: Material Mapping Auto-tuning script with Orion (PR#1464) by @Corentin-Allaire, A no assignee, updated on 2022-09-16
- docs: Exa. TrkX (PR#1517) by @benjaminhuth, A no assignee, updated on 2022-09-16
- fix: Refactor and fix component merging for GSF (PR#1364) by @benjaminhuth, assigned to @asalzburger, updated on 2022-09-13
- feat: Add a tool for writing B-fields to disk in CSV format (PR#1470) by @stephenswat, assigned to @stephenswat, updated on 2022-09-07





### Core: documentation

### Submitted code should have doxygen documentation and readthedocs resources



#### https://acts.readthedocs.io/en/latest/

\* » Acts Common Tracking Software

#### C Edit on GitHub

#### **Acts Common Tracking Software**

Acts is an experiment-independent toolkit for (charged) particle track reconstruction in (high energy) physics experiments implemented in modern C++.

The Acts project provides high-level track reconstruction modules that can be used for any tracking detector. The tracking detector geometry description is optimized for efficient navigation and fast extrapolation of tracks. Converters for several common geometry description packages are available. In addition to the algorithmic code, this project also provides an event data model for the description of track parameters and measurements.

• A tracking geometry description which can be constructed manually or from TGeo and DD4hep

• Implementations of common algorithms for track propagation and fitting. • Implementations of basic seed finding algorithms.



## Core: some selected clients



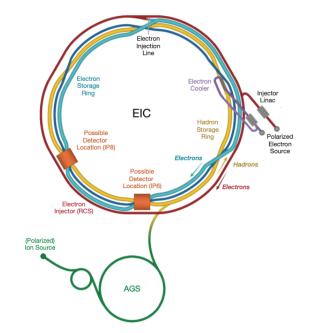


ACTS Vertex reconstruction in Run-3 full ACTS powered reconstruction for Phase-2

full ACTS powered track reconstruction [CSBS Article]



full ACTS powered track reconstruction [FASER Preprint with ACTS mention]



Electron-Ion Collider (EIC) software stack, common track reconstruction software based on ACTS

[CHEP2023 keynote talk]



Test implementation for CEPC design study [CEPC Concept paper]

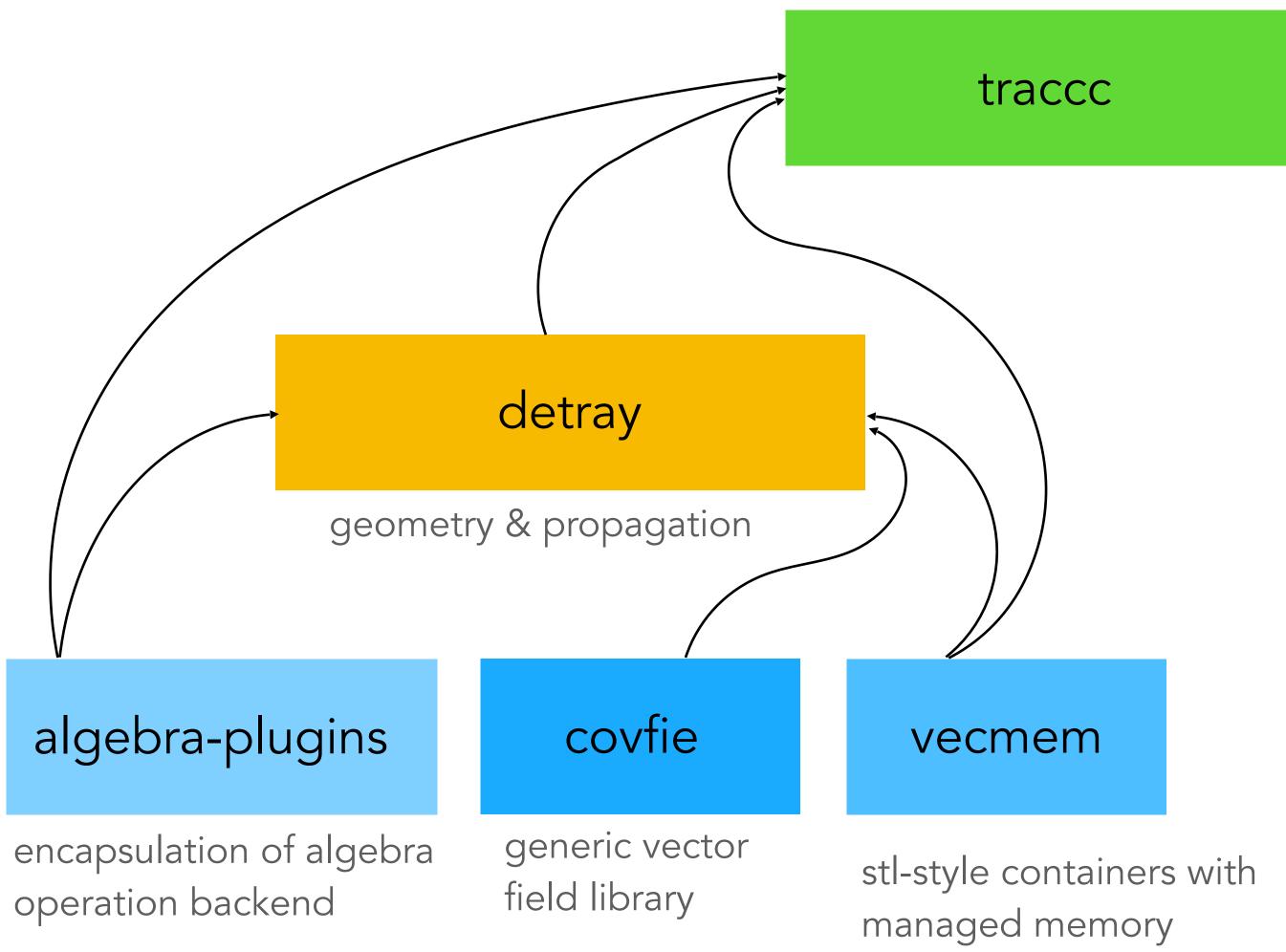
### R&D1

acts-parallelization@cern.ch

CPU/GPU "single source" demonstrator re-implementing the main Core chain



### R&D1: the traccc project



Goal is to establish a track reconstruction chain without algorithmic compromises. CHEP2023 summary talk can be found [here].

full scale demonstrator of an ATLAS-like track reconstruction chain for CPU/GPU

EP-R&D **Programme on Technologies for Future Experiments** 





# R&D1: vecmem & algebra-plugins

vecmem: memory management

- use of std::pmr::memory\_resource to customize the allocation scheme in the host side
- Supports CPU, CUDA, SYCL, and HIP
- Provides STL-like containers for host side for convenience of HEP developers vecmem::vector, vecmem::jagged\_vector (vector of vector), vecmem::array

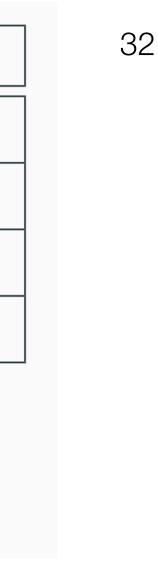
algebra-plugins: encapsulation layer for algebra operations

- targeted at track reconstruction entirely
- dimensions up to 8 (needed for parameter propagation)
- supports device execution where possible and vecmem based backend
- can be used for algebra library benchmarking in realistic applications (instead of mockup benchmarks)

Backend	CPU	CUDA	SYCL	
cmath				
Eigen				
SMatrix				
VC				
Inatively supported				
Inatively supported, but not tested				

: no support

vecmem is a generic library which can be of use to a broader community use, algebra-plugins is not designed for production.



# R&D1: track reconstruction: covfie

A generic vector field library based on composition design

- format, coordinate transform and storage at compile time

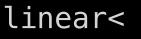
using field\_t =

covfie::field<covfie::backend::transformer::interpolator::linear<</pre> covfie::backend::layout::strided<</pre> covfie::vector::ulong2, covfie::backend::storage::array<covfie::vector::float2>>>;

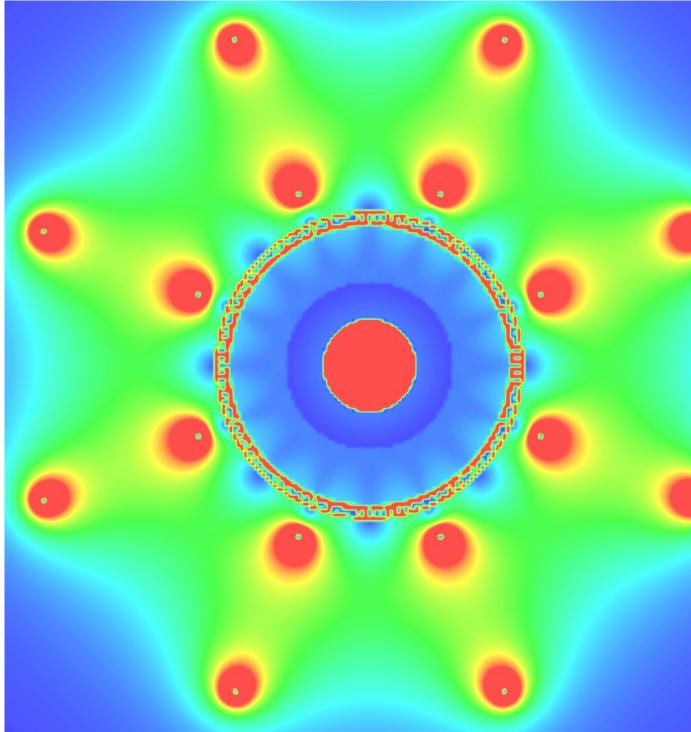
using cuda\_field\_t = covfie::field<covfie::backend::transformer::affine<</pre> covfie::backend::transformer::interpolator::linear<</pre> covfie::backend::layout::strided<</pre> covfie::backend::vector::input::ulong3, covfie::backend::storage::cuda\_device\_array<</pre> covfie::backend::vector::output::float3>>>>;

possible field on GPU





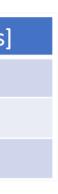
possible field on CPU



ATLAS magnetic field slice at z=0, entirely rendered on a GPU

	8192 X 8192 lookup time [ms]
CPU (Intel i5-7300U)	191719.2
GPU (GTX 1660 Ti)	90.4
GPU w/ texture memory	17.1





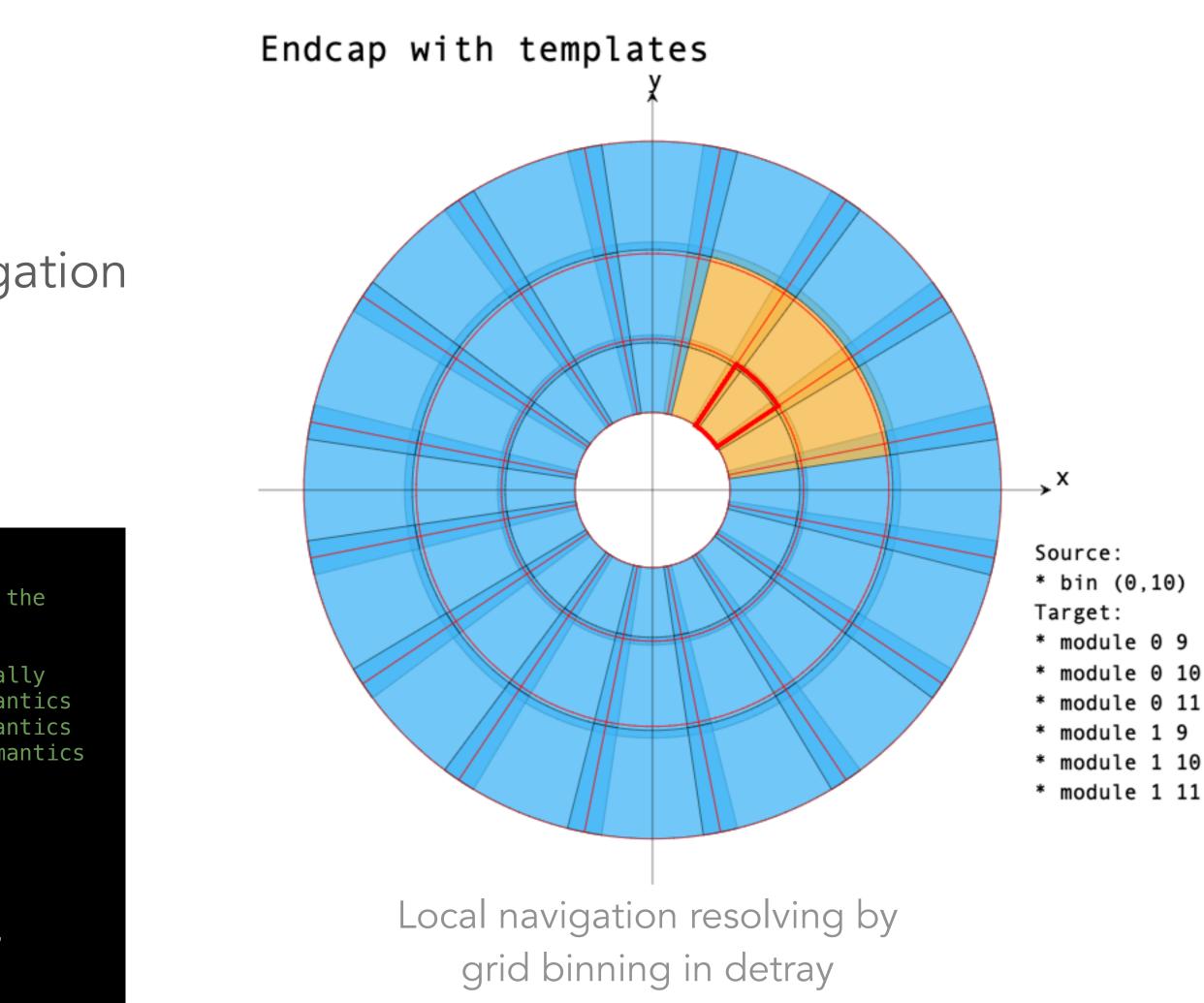
# R&D1: detray (1)

```
Compile-time polymorphic geometry library
```

- bound surface type model and ACTS navigation
- polymorphism achieved by type unrolling
- device specialization through vecmem

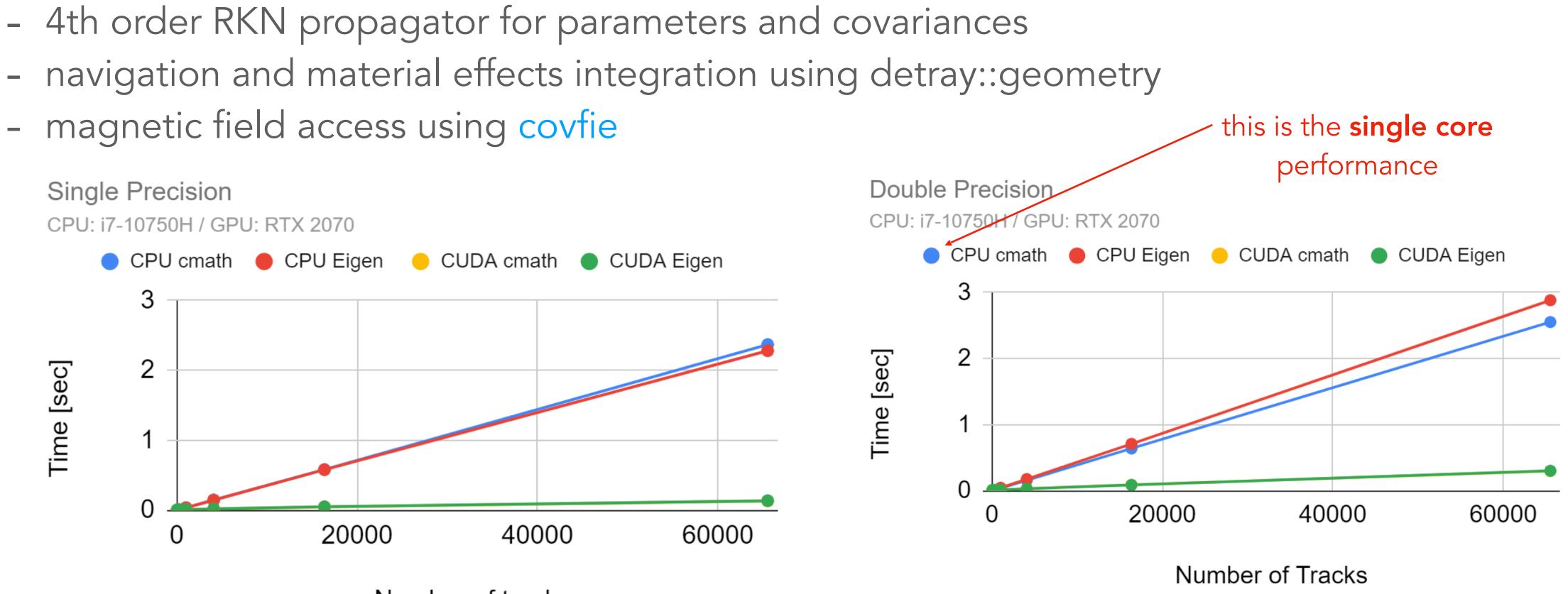
```
/** The detector definition.
 * This class is a heavy templated detector definition class, that sets the
 * interface between geometry, navigator and grid.
 * @tparam metadata helper that defines collection and link types centrally
 * @tparam array_type the type of the internal array, must have STL semantics
 * @tparam tuple_type the type of the internal tuple, must have STL semantics
 * @tparam vector_type the type of the internal array, must have STL semantics
 * @tparam source_link the surface source link
template <typename metadata,</pre>
          template <typename, std::size_t> class array_t = darray,
          template <typename...> class tuple_t = dtuple,
          template <typename...> class vector_t = dvector,
          template <typename...> class jagged_vector_t = djagged_vector,
          typename source_link = dindex>
class detector {
```

detray & VecGeom developers are already in contact and initial exchange, with plenty of room for more collaboration.



# R&D1: detray (2)

### Runge-Kutta propagation

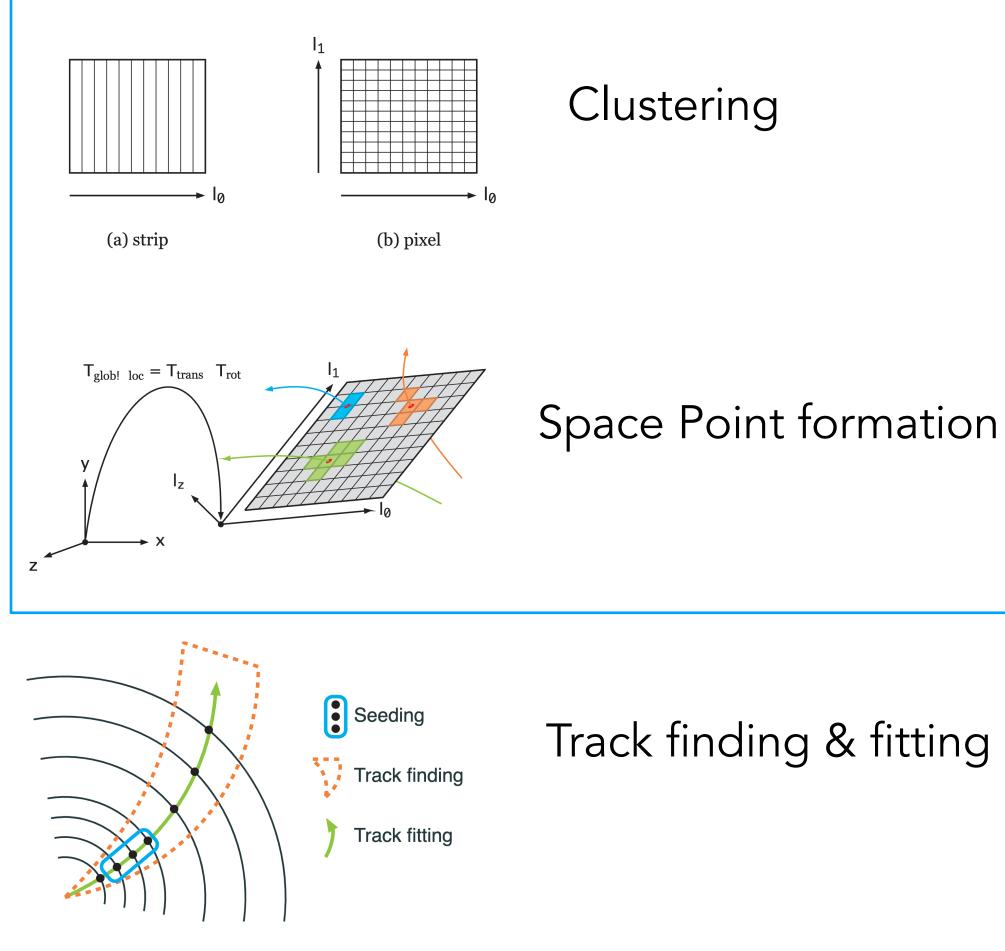


Number of tracks

detray adaptive runge-kutta transport code is relatively self-contained and could serve more communities.

# R&D1: traccc (1)

Full chain demonstrator for track reconstruction on CPU/GPU

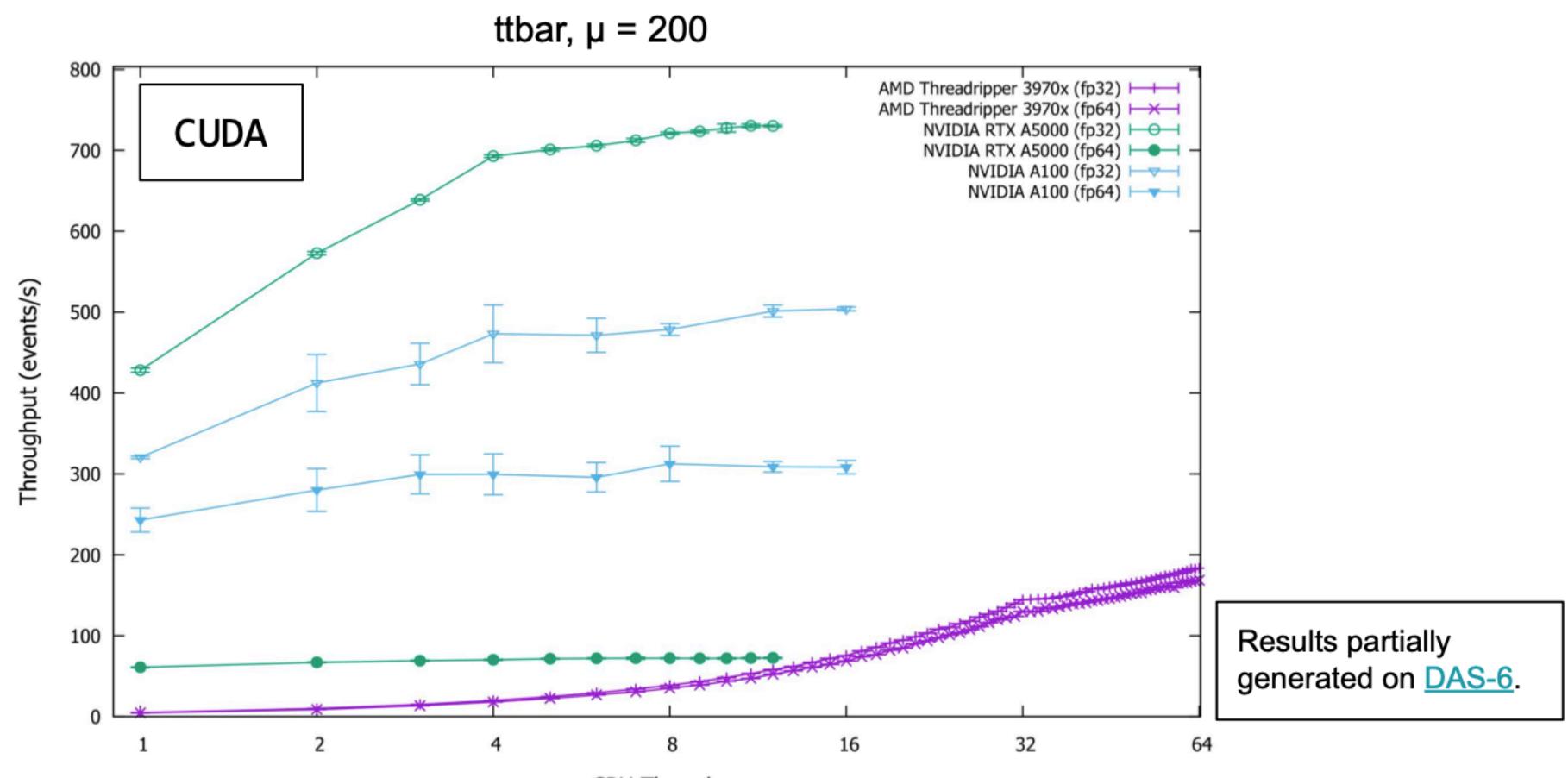


traccc is an ideal playground to gather/share/exchange knowledge about code for heterogeneous systems.

Consolidated code, testing also portability solutions CUDA/SYCL.

## R&D1n: traccc (2)

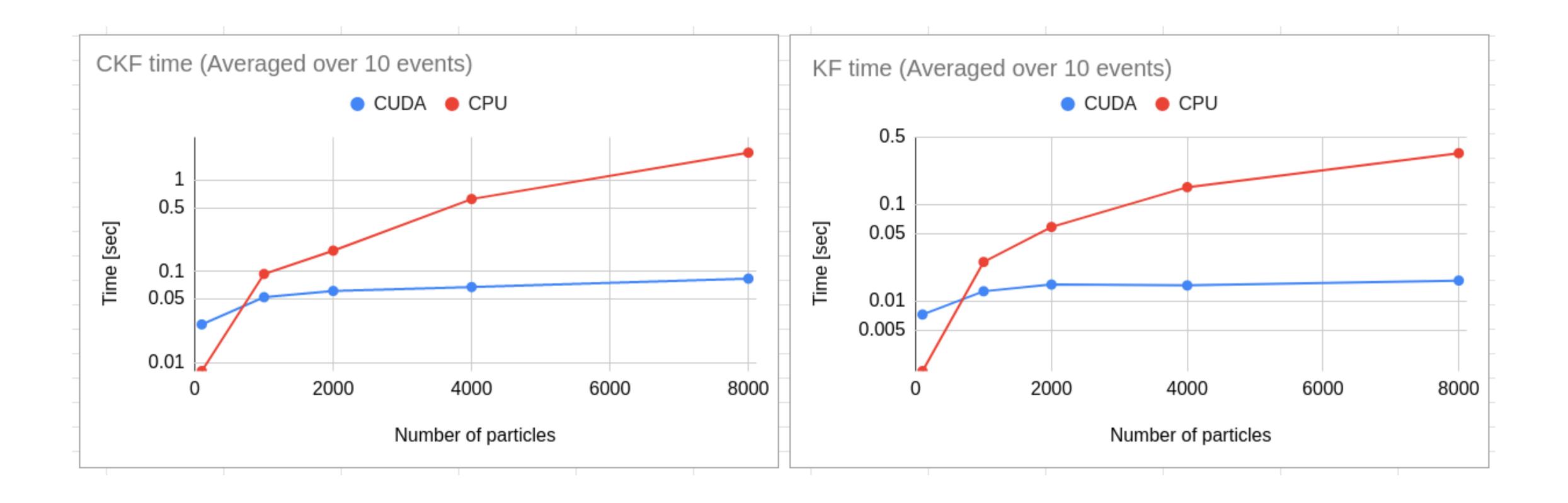
Full chain demonstrator for track reconstruction on CPU/GPU



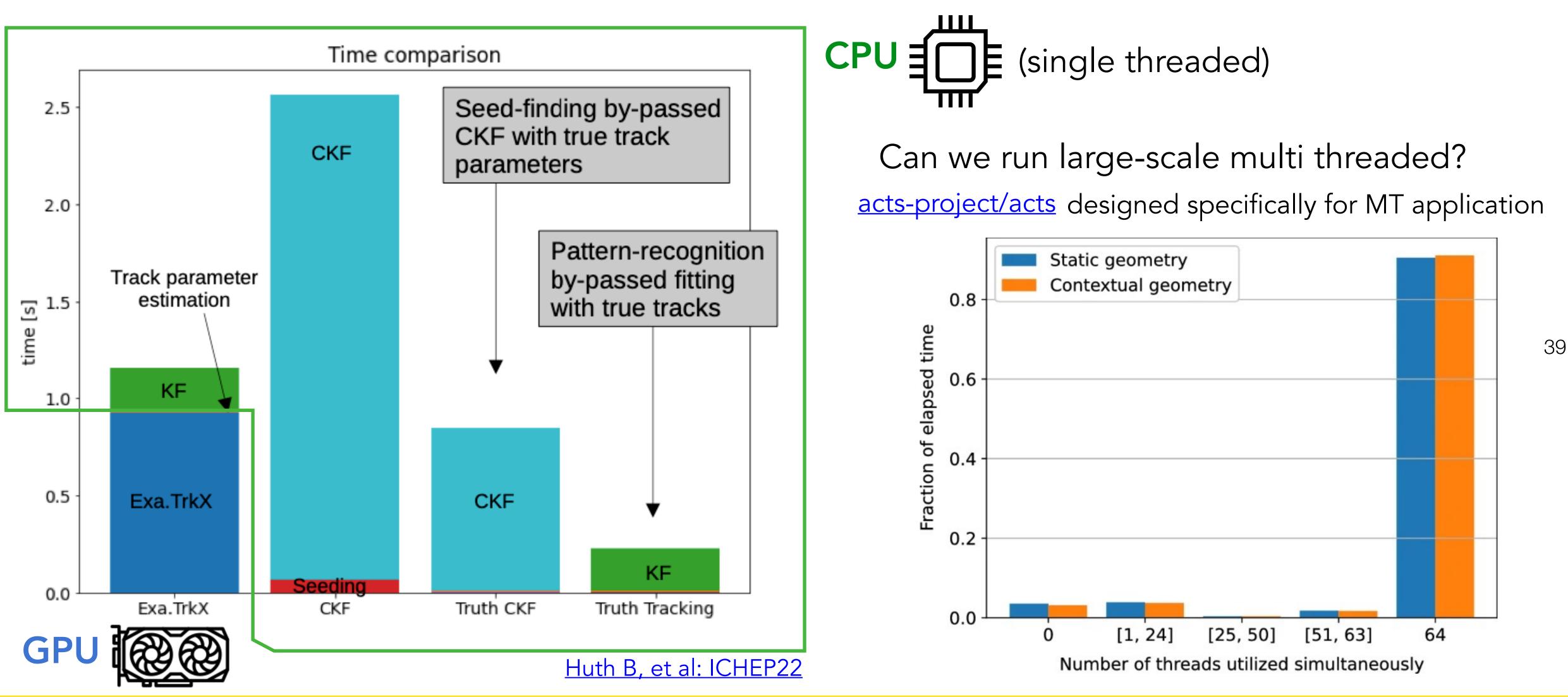
CPU Threads

## R&D1n: traccc (3)

First results on CKF with detray - on toy detector (TrackML pixels)



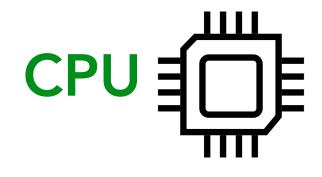
## R&D1: technology BINGO



TrkX

Exa.TrkX project is the state of the art end-to-end Graph Neural Network based track finding library.

# R&D1: technology BINGO



<u>acts-project/acts</u>	x86	aarch64	oneAPI/SYCL	CUDA	<u>acts-project/traccc</u> <u>acts-project/detray</u>
Core Line	tested	tested	superseded	superseded	<u>acts-project/covfie</u> <u>acts-project/vecmem</u>
	tested (incomplete*)	tested (incomplete*)	tested (incomplete*)	tested (incomplete*)	R&D Line 1 "parallelization"
R&D Line 2 "machine learning"	tested	not tested	not implemented	tested w x86	

exatrkx & acts-project/acts





## R&D2

acts-machinelearning@cern.ch

Machine learning and ML assisted modules for track reconstruction

## R&D2: machine learning application and assistance

### Diverse ML (assisted) applications

- ML module research:

ML Ambiguity Solver

[C. Allaire, CHEP2023, Parallel Tallk]

**ML** Navigator

- integration of ML partial or end-to-end pipelines

Exa.TrkX + ACTS

Hashing + ACTS

- ML technology enhanced

Parameter Tuning

Auto-diff covariance transport

## Development and R&D, add-ons:

acts-developers@cern.ch

CPU multi-threaded library of

### R&D1

acts-parallelization@cern.ch

CPU/GPU "single source" demonstrator re-implementing the main Core chain

### Add-ons

OpenDataDetector ActSVG

## **R&D2**

acts-machinelearning@cern.ch

Machine learning and ML assisted modules for track reconstruction

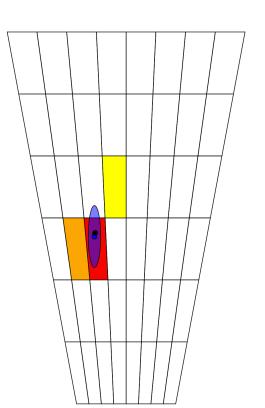
## Plotting: actsvg

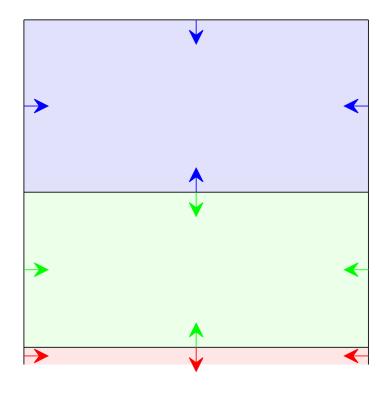
2D plotting library dedicated for tracking

- No dependencies, C++ header only, no ACTS dependency
  - ACTS and detray translate into

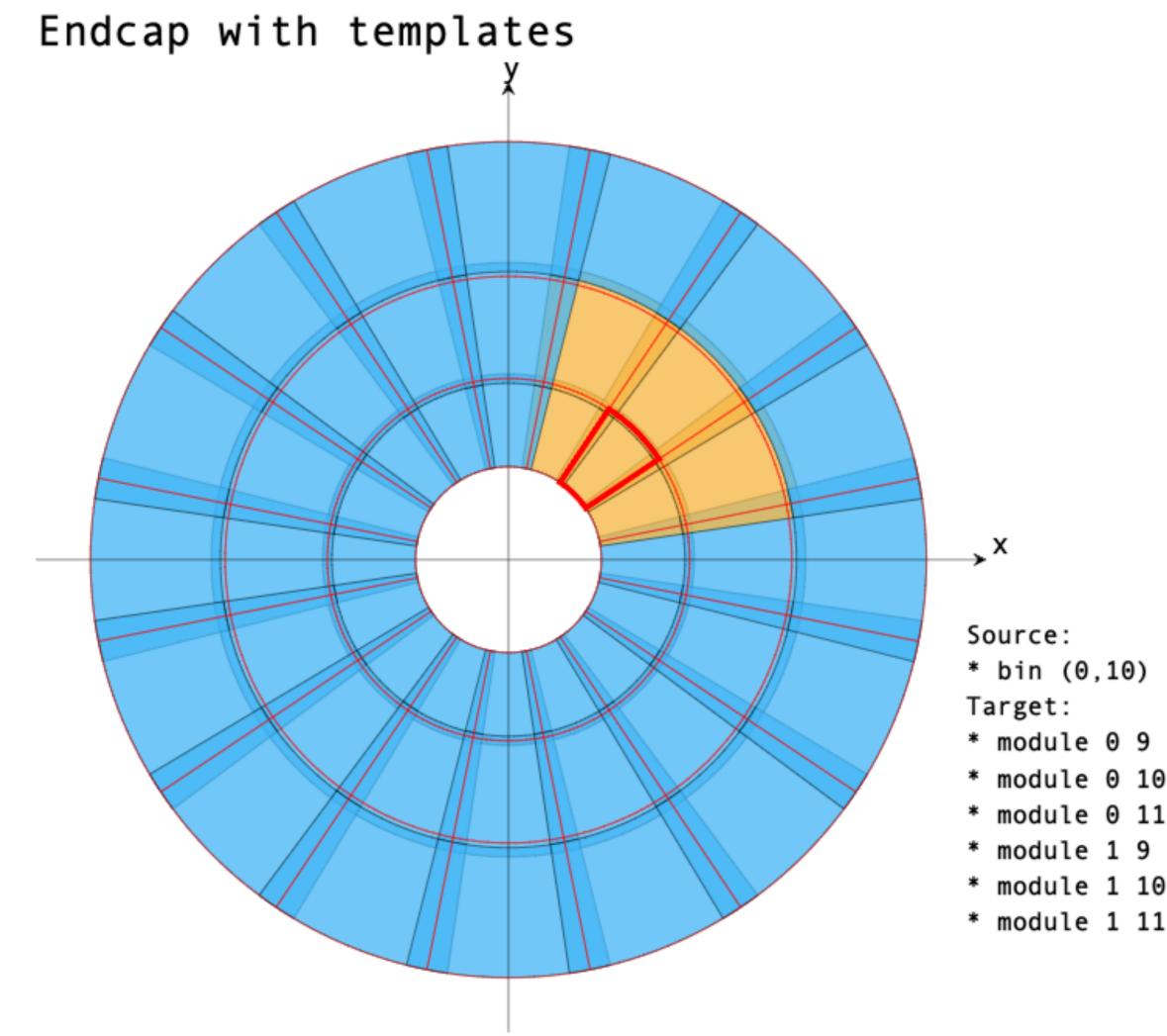
actsvg::meta objects

- Plot geometry & geometric relations (on mouse over effects for debugging)
- Plot clusters & cluster information









## Community: Open Data Detector & key4hep

Evolution of TrackML detector

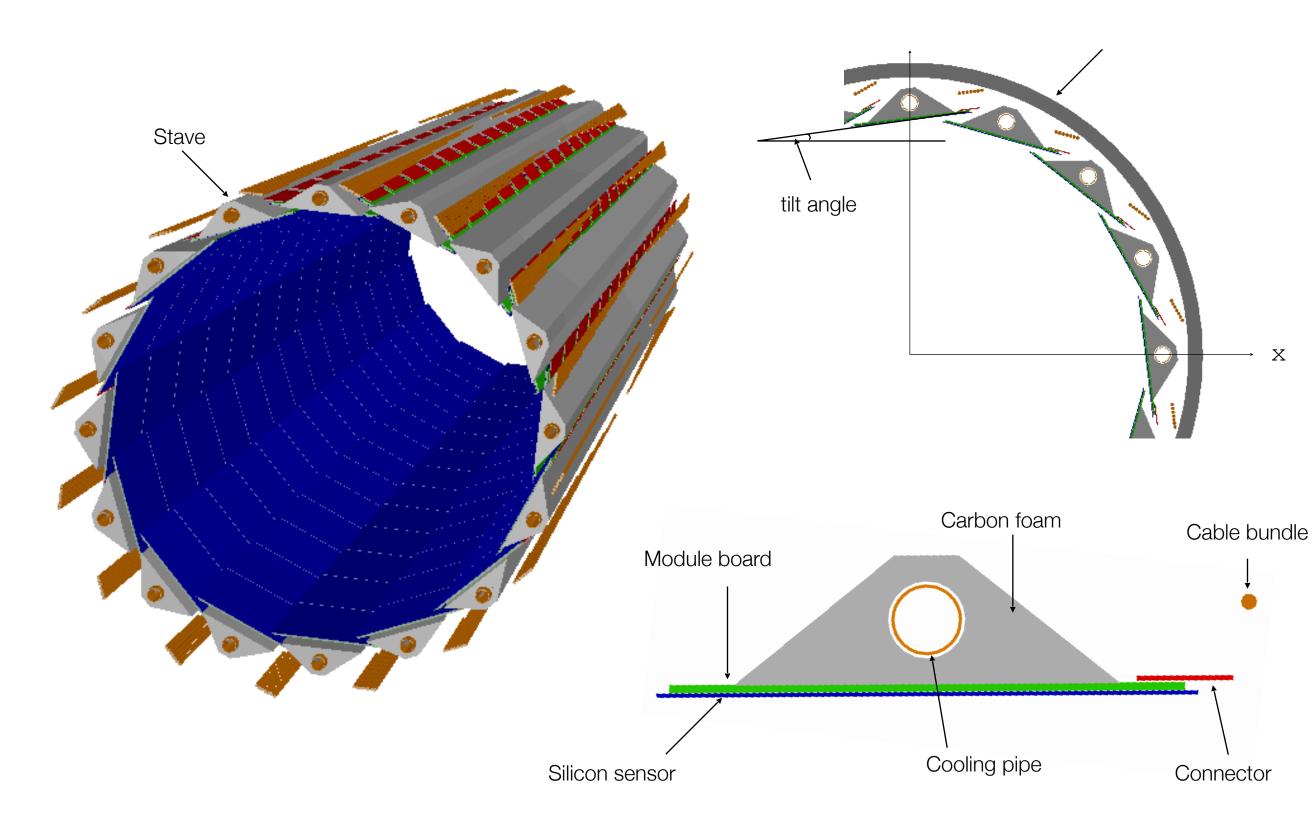
- Re-implemented in DD4Hep to enable full/fast simulation
- Quasi-realistic feedback to allow real-life scenario testing of algorithms
- Supports TrackML output format through ACTS binding (work ongoing to also support edm4hep)

ACTS integration into key4hep SW stack

- Codename: acts4hep
- Summer student project to make a ACTS Gaudi based demonstrator

[AS, CHEP2023 Parallel talk]





# Concluding remarks

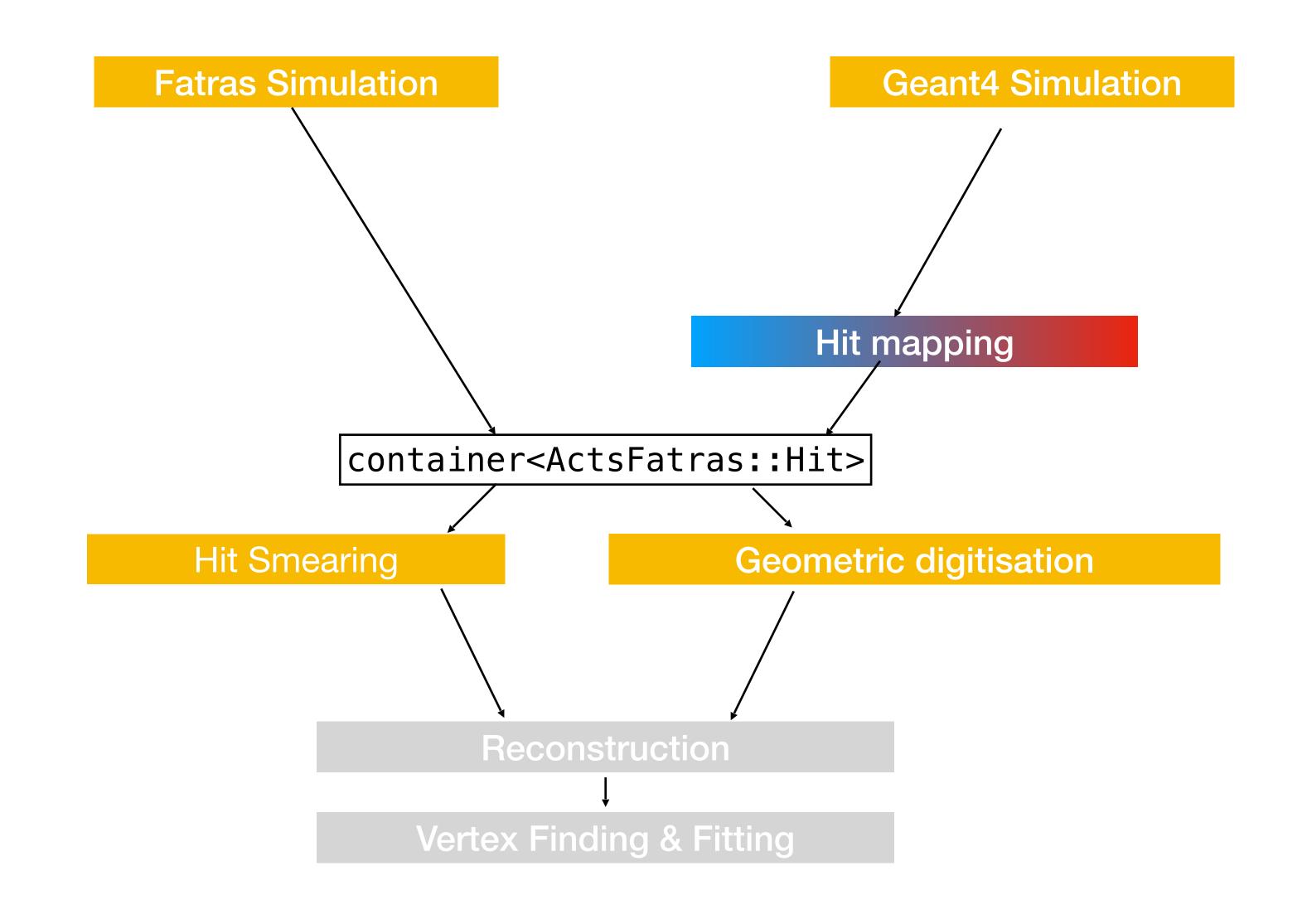
### ACTS is a community driven software project - idea is to develop a broadly carried, supported and sustainable component library

Join. Enhance. Profit. Give.





## Core functionality: simulation input



## Core functionality: a tracking demonstrator chain

