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### ... and its application to CEPC

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for experiments to assemble high quality track reconstruction

for algorithmic and technology research



Built upon a huge stack of experience and knowledge



to foster inter-experiment exchange and development

An [extended version] of this talk can be found as the introduction of the ACTS4NP Workshop, May 20225, Berkeley, US















2 very different tracking systems with different technologies: ATLAS was forced to develop some common/generic code

Generalised ATLAS Tracking code an imported into a standalone repository that became A(C)TS (initial commit Nov 11, 2015)

A lot of the concepts are based on ATLAS Run 1-2-3 tracking code, however, significant extensions/augmentations are have happened ever since.

Common track reconstruction code for ATLAS Inner Detector and Muon Spectrometer















2 very different tracking systems with different technologies: ATLAS was forced to develop some common/generic code



Given the historic origin of the project, several algorithms have an implicit bias towards working better for collider-like experiments,

Wherever possible we are trying to remove this bias w/o losing the underlying features and power.

Common track reconstruction code for ATLAS Inner Detector and Muon Spectrometer













## What is in the toolbox?

Geometry & Material

Event Data Model

Track Finding & Fitters

Vertexing













Reality



Relatively detailed description using a 3D geometry modeller (DD4hep, TGeo, GeoModel) usually interfaced to Geant4

acts / Core

Geometry building in ACTS:

- representing sensitive surfaces
- simplifying material

ACTS material mapping mechanism















# Geometry & Material

ACTS then translates this into a fully navigable geometry model

Navigation model of Open Data Detector (ODD)

### This comes together with an embedded navigation:

core of most track finding and fitting modules















e.g. track parameterization



 $ec{x} = (l_0$ 

acts / Core

$$(p,l_1,\phi, heta,q/p,t)^T$$



In addition: measurement representation, tracks (multi-trajectory), vertices, ...









ACTS deploys a series of algorithms & algorithmic chains:

- Track fitting:
- Vertex reconstruction:

# Algorithms:

## - First stage pattern recognition:

- clustering & space point formation

## - Seeding & track following:

- Different seeding algorithms

- Combinatorial Kalman Filter

## - Global pattern recognition:

- Hough transformation

- Kalman filter, Gaussian Sum filter, Global Chi2 Fitter

- Iterative finding, Annealing based finding

- Billoir Fitter, Multi Adaptive Fitter











# Summary: baseline track reconstruction chain













# Summary: baseline track reconstruction chain

Space points

Ready-to use tools, that only require embedding into an experiment's software framework & geometry.

**CPU** targeted, fully **C++20** compliant

Design-level parallelism and contextual data (conditions data) support: - alignable detectors - calibration and detector conditions data



**Resolved Tracks** 











# Enabling R&D is a key aspect

plug-and-play framework & extension capability

## dedicated R&D lines

e.g. traccc



test setup with quasi-realistic detector











# Track reconstruction on GPUs

traccc is the umbrella project for our massively parallel track reconstruction aiming an GPGPUs

split off into a dedicated set of repositories (currently) to allow and facilitate disruptive development



Hits

Aim is to provide **offline-quality reconstruction** on GPUs.

traccc



Re-implementation of this chain, including all aspects mentioned.















operation backend

field library

managed memory







# Compile-time polymorphic geometry and material description



### **R&D PLATFORM**





## traccc

## detray

### geometry & propagation

















Conversion for Gen2 type geometries has been showcase, Gen3 type geometry should get native conversion support into the detray description.













on host and device.



## traccc

# Composable generic vector field library, allows to describe complex fields

covfie

generic vector field library

ATLAS magnetic field slice rendered on an NVIDIA GPU.













traccc was established as a stand-alone R&D project: - conceptually following the ACTS track reconstruction concepts - unavoidably the repos have diverged already

Long-term maintainability of two different repository structures is questionable - re-integration of traccc into the ACTS core project and code separation into a respective CPU and GPU location is foreseen - Level of code sharing is not yet understood















Open Data Detector (ODD)

## traccc











# Example framework

showcase how to assemble a track reconstruction chain using the tools from the toolbox

allow to easily introduce new/alternative algorithms and test them

serves as a test environment for quality/performance monitoring



## plug-and-play framework

## ACTS ships with a **test** framework, which is not intended for production

xamples	
Algorithms Detectors Framework Python	exemplary algorithm steering via python bindings







# **R&D** Examples

## GNN chain





## plug-and-play framework

## Track finding with Graph Neural Network based on formally known as Exa.TrkX GNN setup















# Open Data Detector and example framework

plug-and-play framework

realistic test setup

This is our main test chain showcasing a complete tracking chain:

Scripts/Python/full\_chain\_odd.py

Basis of our performance testing and monitoring.









![](_page_23_Picture_2.jpeg)

![](_page_23_Picture_3.jpeg)

![](_page_23_Picture_4.jpeg)

### README.md

### The ACTS (A Common Tracking Software) Project

The ACTS project was launched in 2016 as a feasibility study aiming to encapsulate the common and re-usable components of the ATLAS Common Tracking Software for broader use in the community. From the very beginning it was targetting at high quality, generic, modernly designed components that can be used to assemble track and vertex reconstruction applications for high energy, nuclear and heavy ion physics experiments.

The ACTS core project implements event data model, geometry, and tracking and vertexing tools in C++, following the C++20 standard, and aims at minimal dependecies for the core software stack. However, customizable extensions and interface layers to community libraries are available and can be augmented to the core package.

### **Project organization**

ACTS is organized in a core project <a href="https://acts-project/acts">acts-project/acts</a> which holds the software components and a simple example/demonstration framework that showcases typical track reconstruction applications using the OpenDataDetector.

Furthermore, it hosts an umbrella project, called traccc that aims to re-implement the standard Acts chain for massively parallel hardware. traccc relies on the sub libraries:

- vecmem: a library for the memory management of containers
- covfie: a covariant vector field library, e.g. for the description of the magnetic field
- detray: a GPU friendly geometry library for describing the reconstruction geometry
- algebra-plugins: an abstraction layer for linear algebra and float precision

### Supported by

![](_page_23_Picture_17.jpeg)

ERN EP &D	The CERN EP department has launched a strategic R&D programme on technologies for future experiments. This initiative covers detector hardware, electronics, software and detector magnets for new experiments and detector upgrades beyond LHC phase II.
RIS-HEP	IRIS-HEP is a software institute funded by the National Science Foundation. It is developing state-of-the-art software cyberinfrastructure required for the challenges of data intensive scientific research at the High Luminosity Large Hadron Collider (HL-LHC) at CERN, and other planned HEP experiments of the 2020's.
IDAInnova	Discoveries in particle physics are technology-driven; AIDAinnova will provide state-of-the-art upgrades to research infrastructures, such as test beams, in order to unfold the scientific potential of detector technologies. The project will run for a duration of four years from April 2021 to March 2025 and is co-funded by the European Commission under its Horizon 2020 programme.
ERN lextGen riggers	The Next Generation Triggers project, or NextGen, started in January 2024 as a collaboration between CERN (the Experimental Physics, Theoretical Physics and Information Technology Departments) and the ATLAS and CMS experiments funded by the Eric and Wendy Schmidt Stratic Fund for Fundamental Research. The key objective of the five-year NextGen project is to get more physics information out of the HL-LHC data.

### O View as: Public ▼

You are viewing the README and pinned repositories as a public user.

Get started with tasks that most successful organizations complete.

### Discussions

Ø

Set up discussions to engage with your community!

Turn on discussions

### People

![](_page_23_Picture_27.jpeg)

Invite someone

### Top languages

![](_page_23_Figure_30.jpeg)

Most used topics

Manage

particle-track-reconstruction physics-experiment (simulation)

![](_page_23_Picture_34.jpeg)

![](_page_24_Picture_0.jpeg)

![](_page_24_Figure_1.jpeg)

![](_page_24_Picture_2.jpeg)

![](_page_24_Picture_3.jpeg)

# Experiment landscape

![](_page_24_Picture_5.jpeg)

![](_page_24_Picture_6.jpeg)

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![](_page_24_Picture_8.jpeg)

![](_page_24_Picture_9.jpeg)

![](_page_25_Picture_0.jpeg)

![](_page_25_Picture_1.jpeg)

# Developer book

![](_page_25_Figure_3.jpeg)

## **Core project has :**

- 82 different contributors
- 186 forks
- 346 unique cloners
- 115 stars
- 3200 merged pull requests

See discussion about future and structure of traccc.

→ Fully C++20 compliant

![](_page_25_Picture_12.jpeg)

![](_page_26_Picture_0.jpeg)

![](_page_26_Picture_1.jpeg)

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

# Community - Contributing

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

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

## Tuesday 17:00, CE(S)T

Discuss at the open develops meeting

https://indico.cern.ch/category/7968/

occasional Asia-friendly time slot 9:00 CE(S)T

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

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![](_page_27_Picture_3.jpeg)

Solid development program needs some conventions and rules

# <u>Code quality & style:</u>

1	▶ Run pre-commit runall-filesshow-diff-on-failure
12	clang-format
13	Trim Trailing WhitespacePassed
14	Fix End of FilesPassed
15	Check YamlPassed
16	Check for added large filesPassed
17	black-jupyterPassed
18	gersemi
19	codespellPassed
20	license
21	include_guardsPassed
22	pragma_oncePassed
23	type_tPassed
24	boost_testPassed
25	cmake_optionsPassed
26	Leftover conflict markersPassed
27	math_macrosPassed
28	codegen_dependenciesPassed

Several checks in place that run automatically on PRs

- Format, style, conventions, spelling using a **pre-commit** check

![](_page_27_Picture_11.jpeg)

![](_page_27_Picture_12.jpeg)

![](_page_28_Picture_0.jpeg)

![](_page_28_Picture_1.jpeg)

Solid development program needs some conventions and rules

## <u>Code quality & style:</u> Several checks in place that run automatically on PRs

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-all-files --show-diff-on-failure

loud (bot) commented 3 days ago

### ty Gate passed

<u>sues</u> ed issues

<u>y Hotspots</u> verage on New Code olication on New Code

details on SonarQube Cloud

## code analyzer using **sonarcloud**

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. . .

![](_page_29_Picture_0.jpeg)

![](_page_29_Picture_1.jpeg)

![](_page_29_Picture_2.jpeg)

Solid development program needs some conventions and rules

## <u>Code quality & style:</u> Several checks in place that run automatically on PRs

![](_page_29_Picture_6.jpeg)

1 • Run pre-commit run --all-files --show-diff-on-failure **sonarqubecloud** (bot) commented 3 days ago github-actions (bot) commented 3 days ago • edited 👻 . . . **I**: Physics performance monitoring for **21f5b8a** Full contents physmon summary • 🔽 Particles fatras • **V** Particles geant4 • 🔽 Particles ttbar • 🔽 Vertices ttbar 🔹 🔽 Truth tracking (KF) 🔹 🔽 Truth tracking (GSF) • 🔽 Truth tracking (GX2F)

Performance monitoring & regression tests.

![](_page_29_Picture_9.jpeg)

![](_page_30_Picture_0.jpeg)

![](_page_30_Picture_1.jpeg)

![](_page_30_Picture_2.jpeg)

Solid development program needs some conventions and rules

## <u>Code quality & style:</u> Several checks in place that run automatically on PRs

![](_page_30_Figure_6.jpeg)

cts-project-service commented 2 days ago	Member	• • •
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d bot) commented 3 days ago	• • •	

V All tests successful

status	job	report
	report_pull_request	
	run_workflow_tests_run4_mc	
	run_workflow_tests_run2_mc	

![](_page_30_Picture_10.jpeg)

## Dedicated ATLAS integration tests

![](_page_30_Picture_12.jpeg)

![](_page_31_Picture_0.jpeg)

![](_page_31_Picture_1.jpeg)

![](_page_31_Picture_2.jpeg)

## <u>Code quality & style:</u> Several checks in place that run automatically on PRs

![](_page_31_Figure_6.jpeg)

## Solid development program needs some conventions and rules

all-filesshow-diff-on-failure	
oud (bot) commented 3 days ago ···	
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Physics performance monitoring for 21f5b8a	
acts-project-service commented 2 days ago	
Athena integration test results [d19a6d7]	
All tests successful	
1 neutral, 1 pending, 1 in progress, 2 skipped, 38 successful checks	^
Go Builds / linux_examples_test (pull_request) Successful in 16m	• • •
Builds / linux_physmon (pull_request) Successful in 28m	• • •
Builds / linux_ubuntu (pull_request) Successful in 36m	

## Unit and python level tests on PRs.

![](_page_31_Figure_10.jpeg)

![](_page_31_Picture_11.jpeg)

![](_page_32_Figure_0.jpeg)

![](_page_32_Picture_3.jpeg)

![](_page_32_Picture_5.jpeg)

![](_page_32_Picture_7.jpeg)

![](_page_32_Picture_8.jpeg)

![](_page_32_Picture_9.jpeg)

# ACTS Tracking chain for CEPC

Track finding implemented in two steps

- Silicon track finding: VTX + ITK
  - Seeding in VTK + ITK (9 layers) ~ 80 triples/particle
  - Duplicate seed removal and successive CKF track finding
- Full tracking: VTX + ITK + TPC + OTK
  - With filtered seeds & parameters from Silicon track finding

![](_page_33_Figure_7.jpeg)

![](_page_33_Picture_10.jpeg)

# ACTS Tracking chain for CEPC

## µ Tracking efficiency ("Technical efficiency")

![](_page_34_Figure_2.jpeg)

![](_page_34_Figure_3.jpeg)

![](_page_34_Picture_4.jpeg)

# ACTS Tracking chain for CEPC

## µ resolution at different momenta

![](_page_35_Figure_2.jpeg)

![](_page_35_Picture_4.jpeg)
## ACTS Tracking chain for CEPC

### Computing performance





Tested with single thread at: Intel(R) Xeon(R) Silver CPU 4214 @ 2.20GHz





## Concluding remarks

### **Community is growing**

Join. Contribute. Collaborate.

### ACTS has matured as a toolkit

- sPHENIX, FASER, LUXE are running in data taking mode - ATLAS Phase-2 track reconstruction is fully based on it (Run-3 vertex reconstruction is ACTS based) - List of features and tools is constantly increasing

### Several R&D projects within the ACTS ecosystem

- prominent: GPU R&D line traccc - GNN based tracking available

- recent, strong interest from the nuclear physics community - will be distilled into a governance document soon





... a lot of backup slides ahead ...









Geometry & Material

### What is in the toolbox?

41









## Experiment description



Relatively detailed description using a 3D geometry modeller (DD4hep, TGeo, GeoModel) usually interfaced to Geant4

Geometry building in ACTS:

- representing sensitive surfaces
- simplifying material









### TOOLBOX





### Experiment description















### Experiment description



Relatively detailed description using a 3D geometry modeller (DD4hep, TGeo, GeoModel) usually interfaced to Geant4

Geometry building in ACTS:

- representing sensitive surfaces
- simplifying material

ACTS material mapping mechanism



44





### Experiment description: geometry

Core concept of ACTS geometry is the Surface class - all higher level geometry objects are composed of those



- omission of layers in favor of layer volumes
- composable building instructions with blueprint nodes
- customizable navigation structure
- built-in support for GPU geometry model (detray)

- Gen1 geometry: BoundarySurface, Layer, Volume
- Gen2/3 geometry: Portal, Volume
- makes them reachable and navigable
  - We are in the process of changing to the **Gen3** geometry description:















### (2) Define a set of surfaces with some binning definition



acts / Core / include / Acts

Material







More work for volume based Material needed still.

Geant4 material is projected onto next surface with eligible for mapping.









(3) Validate





Ongoing work to decouple that from the framework.













## Experiment description: alignment



Detectors in real life are usually misaligned, need a mechanism to allow for event-wise misalignment.

namespace Acts { class Module { };

### Built-in parallel processing enhanced alignment

```
@param gctx the geometry context (e.g. alignment)
   @param input the input data
OutputData geometricOperation(const GeometryContext& gctx,
                              const InputData& input) const;
```













Ideal trajectory

### A particle through the detector











What is in

Geometry & Material

### What is in the toolbox?





(1) Track parameters



 $ec{x} = \left( l_0, l_1, \phi, heta, q/p, t 
ight)^T$ 







(1) Track parameters



Ļ

This is not necessarily the optimal choice for telescope like detectors where traditionally the detection planes are often described along the global z axis.

Some experiments, like LDMX have thus rotated the reconstruction frame towards positioning along x.













(2) Measurements

### Bound

Pixe

Pixel mea

Strip measu

Strip measu

Drift time

Track se

Parameter	lo	$l_1$	$\phi$	θ	q/p	
track parameters						
el measurement						
asurement with time						
urement (along local x)						
urement (along local y)						
circle measurement						
egment (straight line)						









(2) Measurements

E.g. planar measurements









(2) Measurements



Creation from single cells using connected component labelling

4- and 8-cell connectivity supported









(2) Measurements



Creation from single cells using connected component labelling

4- and 8-cell connectivity supported









(2) Measurements





Connected component labelling is a deterministic problem and has one exact answer.

Different implementations, however, differ a lot in speed and parallel execution capabilities.

Creation from single cells using connected component labelling

4- and 8-cell connectivity supported











### What is in the toolbox?

Geometry & Material

Event Data Model

Track Finding & Fitters







Space points

Next step: expression of those measurements as 3D points

























## Seeding













# Seeding

### Find doublets and successively trips of hits compatible with cruderarde Readinate tion steps (classical)

- track fit (estimation of track parameters and errors): {x,C}
- secondary particles
- anymore









# Seeding

### Find doublets and successively trips of hits compatible with cruderard Reand steps (classical)

- track fit (estimation of track parameters and errors): {x,C}
- secondary particles

classical picture does not work and associated json file API.



Layers that are permitted for seeding can be configured in ACTS with a seeding struct,

This simple example has already 12 correct seeds for 3 particles; seeding is the firs part of combinatorial explosion of the track finding problem.







### Alternative seeders

Graph based seeders are becoming more & more popular as they tend to produce longer seeds (and thus suppress the combinators): - GBTS (Graph Based Track Seeder) - GNN (Graph Neural Network),

see later

ACTS also deployed additional seeders:

- Orthogonal Seeder
- Telescope Seeder









# Track following

Tra









## (Combinatorial) Kalman Filter

Default track finding strategy: Using a Kalman Filter that is allowed to test different path hypothesis.











## (Combinatorial) Kalman Filter

Default track finding strategy: path hypothesis.





Using a Kalman Filter that is allowed to test different

The correct fitting results relies on a good initial parameter estimate (usually from the seed) and a correct handling of the intrinsic error and material effects.









## Combinatorial Kalman Filter

Default track finding strategy: Using a Kalman Filter that is allowed to test different path hypothesis.

**Track tips:** a trajectory are implemented in the ACTS MultiTrajectory track class.











### Pure track fitters: Global x2 Fitter

Kalman filter is a linear progressive filter and can be locally unstable.

fitter is also available.

measurement regimes, e.g. signed drift circles.








# Dedicate track fitter: Gaussian Sum Filter

Multi-variant extension of the Kalman filter to model highly non-gaussian process noise from Bremsstrahlung.











## Dedicate track fitter: Gaussian Sum Filter

Does improve momentum estimates for electrons









# Requirement for fitters: propagation

the detector:

- precise integration of equation of motion - adequate handling of detector material - predictive navigation to find/identify sensitive

detector elements

Track (and vertex) fitters rely on a correct transport of the track through

















# Propagation

**Stepper:** 

Field integration for parameter and covariance transport: - StaightLineStepper AtlasStepper (RKN) EigenSteppen (RKN) - SympyStepper (RKN)

Magnetic field access needed

### **Propagator:**

Transport from one point to another, extendable functionality with Actors

### **Navigator:**

Talks to tracking geometry to provide Surfaces, Portals, Material

acts / Core / include / Acts EventData MagneticField Material Navigation Propagation







# Ambiguity Solving

Historic name (from ATLAS) mainly trying to reduce duplication in the output candidate track collection: - eliminate duplicates (keep better one) - eliminate/suppress fake tracks - re-assign hits (requires re-fit)





Hit re-assignment as in ATLAS' original ambiguity solver, is not yet supported.

acts / Core / include / Acts

AmbiguityResolution













## Vertex reconstruction

## Full primary vertex reconstruction suite including time fitting

100

[bs]

-50

-100

-150

### **Iterative Finding**

vertices are found one by from seedsunique track to vetrexIdeal for low vertex multiplicity/

Ideal for low vertice
 density

ODD Simulation  $t\bar{t}, \langle \mu \rangle = 200$ 



## Multi Adaptive Finding

vertices are found simulatously from seeds:

- tracks can be multiply assigned to vertices with different weights
- More performant for high vertex multiplicity/density

acts / Core / include / Acts









Pointing, mass constrains and decay chain fitting is however not (yet) implemented.







# **R&D** Examples

## ML assisted track finding modules

## ML based ambiguity solving



## plug-and-play framework



The framework should allow you to integrate your R&D algorithm in a relatively painless manner into an existing track reconstruction chain.

Algorithms/TrackFindingML











# Developers meeting: PR recap



- Image: Second Second
- Joing fix: Fix very by @andiwand,
- Image: Sector: A by @paulgessin
- Fix: Improve by @andiwand
- fix: Increase state in case by @dimitra97
- fix: Fix lini
   by @cgleggett,
- k refactor: C by @andiwand,

Walk through necessary

The dedicated acts-parallelisation meeting follows the same structure

s: PRs merged between 2025-03-25 and 2025-04-01 I
w turning off Layer center of gravity (#4150) nger, 🜠 reviewed by @asalzburger, merged on 2025-03-25
ertex id grouping in 'ParticleTrackParamExtractor' (#4148) d, 💟 reviewed by @AJPfleger, merged on 2025-03-25
Add a *consuming* data handle that removes a key (#4135) nger, 🜠 reviewed by @andiwand, merged on 2025-03-25
ove and fix some interaction code (#4133) d, 💟 reviewed by @benjaminhuth, merged on 2025-03-25
ase the surfaceCandidateIndex in the Detector Navigator an re initialize navigation of unreachable portal (#4134) 7, 🜠 reviewed by @andiwand, merged on 2025-03-25
nk to spack guide (#4144) :, 🜠 reviewed by @paulgessinger, merged on 2025-03-25
Optionally write track info in 'VertexNTupleWriter' in Examples (#4146) d, 🜠 reviewed by @paulgessinger, merged on 2025-03-26

## Walk through merged PR since the last meeting, discuss if







# Developers meeting: Open PR/issues

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

- In refactor(Ex MuonSegment by @junggjo9,
- feat: Use by @stephensw
- Ci: Spack by @paulgessin
- feat: simple by @asalzburge
- Chore: Zoo by @paulgessir
- In refactor(Ex by @paulgessin
- feat: Add by @ldamenti,

## Highlight developments, discuss, assign reviewers

The dedicated acts-parallelisation meeting follows the same structure (for traccc & friends)

Examples) - Replace the drift circle & simHit EDM by the MuonSpacePoint & ntEDM (#4180)
80-bit high-precision floating point (#4181) wat, <u>inoreviewer</u> , updated on 2025-04-01
(#3980) nger, 🜠 comment by @paulgessinger, updated on 2025-04-01
o <b>ler 2d/3d calculation</b> (#4169) ;er, 🜠 comment by @coderabbitai[bot], updated on 2025-04-01
om in on vertex position in ttbar physmon (#4178) nger, 🜠 reviewed by @andiwand, updated on 2025-04-01
xamples): Untemplate Generic Detector construction (#4176) nger, 🜠 comment by @coderabbitai[bot], updated on 2025-04-01
Error message in SurfaceArrayNavigationPolicy (#4177) Comment by @coderabbitai[bot], updated on 2025-04-01

6/38

