



# **Tracking with A Common Tracking Software**

Xiaocong Ai for the ACTS team

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## The tracking challenge

- Much increased combinatorics with high pileup at future hadron colliders, e.g.
  - ~7k particles/event with <μ> = 200 at High Luminosity LHC (HL-LHC)
  - $<\mu> = 1000$  at FCC-hh
- Much increased CPU needs



# More sensitive to rare phyics, and far more combinatorics!



Estimated CPU resources needed for event processing at ATLAS

## The A Common Tracking Software project

- To prepare a modern open-source experimentindependent tracking toolkit for current and future detectors based on LHC tracking experience
  - Targeting at HL-LHC, but also for sPHENIX, ALICIE, EIC, Belle-II, FASER, MUC ...
- To provide an open-source R&D platform to explore new techniques, parallelization and acceleration









Experiment-independent toolkit for (charged) particle track reconstruction in (high energy) physics experiments implemented in modern C++

#### 

#### simulation reconstruction particle-track-reconstruction physics-experiment

- 🛱 Readme
- MPL-2.0 License
- Solution Code of conduct
- Cite this repository -
- ☆ 64 stars
- ● 10 watching
- **양 82** forks

#### Releases 94



+ 93 releases

#### The ACTS developers team

- 10~15 active developers on Core project
  - ATLAS heavy with increasing external contribution



Contributors 40



+ 29 contributors



supported by

#### **ACTS fosters collaboration**

- World-wide users from particle and nuclear physics, collider and non-collider experiments
  - >10 experiments
    - ATLAS, Belle-II, ALICE, sPHENIX, FASER, EIC, CEPC, LUXE, PANDA, Muon Collider ...
  - >15 institutes
    - CERN, LBNL, ORNL, UC Berkeley, Stanford University, DESY, Universite at Bonn...
  - ~45 forks of the acts repository
- Regular/irregular discussion between developers and experiment users
  - ATLAS, FASER, sPHENIX, ALICE, EIC...



## **ACTS design**

- Modern C++ 17 concepts
- Highly templated design to avoid virtual lookup
- Abstraction of Event Data Model, geometry description, tracking algorithms from specific experiment details (geometry, B field,...)
- Strict thread-safety to facilitate concurrency
- Supports for contextual condition data
  - Calibration, alignment and Magnetic field data
- Minimal dependency (Eigen) to facilitate integration
- Highly configurable for usability
- Well-documented

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



## The tracking tools in ACTS

An alignment prototype

A light-weight test framework with application examples

A fast simulation engine



Core tools for track propagation, track fitting and track finding, vertexing...

# DD4hep Digitization Identification

Plugins to support R&D on new techniques!

#### **ACTS tracking geometry**

- Geometry used for track reconstruction is simplified from full simulation geometry to reduce CPU consumption and speed up geometry navigation
- Material mapping tools allows to map (averaged) Gean4-based full detector material (recorded using Geantino scan) onto either surfaces or volumes



#### **ACTS Surface concept**

- Surface is the key component of tracking geometry
  - Concepts are largely transcribed from ATLAS SW
- Various concrete surfaces to support description of measurement with different detectors (silicon, wire-chamber, drift tube...)
  - Different local coordinate definitions, shapes and boundaries



#### **ACTS track propagation**

- Integration of the fourth-order Runge-Kutta-Nyström method for particle transport in magnetic field
- Allows for transport in dense volumes, e.g. calorimeter
- Support custom actions at each propagation step
  - Material effects handling
  - Material recording
  - Kalman filtering



```
// Propagation loop: stepping
while (/* step */){
    // Perform a step & check the result
    stepper.step(state);
    navigator.status(state);
    // Apply the actors
    actionList(state, result),
    // Check for abort condition
    if (abortList(result, state)) break;
    // Target after stepping
    navigator.target(state);
}
```

#### **ACTS track and measurement parameterization**

- Track parameterization

  - Global:  $\mathbf{f} = (x, y, z, d_x, d_y, d_z, \frac{q}{p}, t)$ Local (bound):  $\mathbf{b} = (d_0, z_0, \phi, \theta, \frac{q}{p}, t)$



Local track parameter represented at the perigee w.r.t. beam line



New feature of time

parameter integration

Local track parameter represented at detector local surface

- Measurement is a vector in subspace of the bound track parameters
  - Easy projection from the track parameters to measurement

$$\mathbf{r}_i = \mathbf{m}_i - \mathbf{H}_i \mathbf{b}_i$$

Calibration of experiment-specific "source measurement" to ACTS measurement is possible during tracking time

## **ACTS track finding/fitting**

- Based on Kalman-filter (KF) algorithm
  - Straightforward handling of material effects
  - Allows for simulataneous track fitting and finding
  - Supports hole search and outlier rejection during fitting
- Track finding follows seeding + combinatorial Kalman filter (CKF)
- Implementation of Gaussian Sum Filter for non-Gaussian extension is on-going
- Non-linear extension of Kalman filter is in place
  - The commonly used (extended) KF in HEP is optimal for linear system





#### ACTS tracking performance: track parameters estimation



#### Pull of track parameters represented at the perigee

<u>arXiv:2106.13593v1</u>



Single muon 400 MeV < pT < 100 GeV, |eta|<2.5 TrackML detector, Bz= 2T

## Track fitting with non-linearity correction

• The non-linearity correction corrects the bias and improves resolution of track parameters significantly!

Single muon (20<pT<100 GeV) Open Data Detector, solenoidal Bz= 2T (ATLAS-like)

<u>arxiv: 2112.09470.</u> Submitted to NIMA X. Ai, H. Gray, A. Salzburger, N. Styles



#### **ACTS tracking performance:** efficiency and fake rate

>99% tracking efficiency and <0.01% fake rate for tt at  $<\mu>=200$  (~3000 charged tracks/event) •



Fake rate

sqrt(s) = 14 TeV, tt, µ = 200 TrackML detector, Bz= 2T

arXiv:2106.13593v1

#### **ACTS vertex finding/fitting**

- Various vertexing tools have been transcribed from ATLAS vertexing algorithms (performance well validated against ATLAS SW)
  - Iterative fitting-after-finding: Iterative Vertex Finder (IVF) (used at ATLAS Run-2)
  - Finding-through-fitting: Adaptive Multi-Vertex Finder (AMVF) (to be used at ATLAS Run-3)



#### **ACTS time performance**

Pure track fitting time ~ 0.2 ms/ track for ~15 detector layers with a single thread



Track propagation time

(C)KF time



arXiv:2106.13593v1

#### **ACTS** application examples



sPHENIX silicon





FASER





#### **ACTS application example: sPHENIX**

- ~1000 tracks/ event in Au+Au collision at sPHENIX
- ACTS provides necessary tracking resolution to resolve high momentum jets
  - $\Delta p/p \leq 0.2\% \cdot p$  (GeV) for pT > 10 GeV tracks
- ACTS provides X8 faster tracking than GenFit package
  - Total tracking time is 10 s/event (fitting time: ~1 s/event)

Comput Softw Big Sci 5, 23 (2021)







## **ACTS application example: EIC ATHENA**

- ACTS is used as the tracking tool for ATHENA proposal at EIC
- Achieved tracking resolution reaches the physics working group requirement





Lots of thanks to Shujie Li and Wenging Fan

#### **ACTS R&D: GPU-accelerated track fitting**

- ALICE, LHCb. CMS are exploring GPU for HLT trigger
- The first look at heterogeneous computing in ACTS was porting a full KF to GPU
  - ~ 4.5X speed gain for >1000 tracks!
  - But not detector agnostic yet



X. Ai, G. Mania, H. Gray, M. Kuhn, N. Styles





Sys.	CPU		S×C×T	Clock rate (GHz)	Mem. (GB)
1	Intel Xeon E5-2698 v3 (Cori-Has	well-CPU)	2×16×2	2.30	128
1	Intel Xeon Phi 7250 (Cori-KNL-CPU)		1×68×4	1.40	96
2	Intel Xeon Gold 5115 (NAF-SL-CPU)		2×10×2	2.40	376
Sys.	GPU	FP32 cores	FP64 cores	Clock rate (GHz)	Mem. (GB)
1	GV100-SXM2 (Cori-V100-GPU)	5120	2560	1.53	16
2	GP100-PCIe (NAF-P100-GPU)	3584	1792	1.48	16

#### ACTS R&D: accelerating the full tracking chain

- On-going development towards a full tracking chain on GPU in ACTS community
  - Needs general solutions for difficulties with GPU: C++ STL containers and algorithms not usable, polymorphism not supported ...

Vectorised data model base and helper classes.			
● C++ ☆ 8 Ф MPL-2.0 😵 7 ⊙ 2 (1 issue needs help)			
detray       Public         Test library for detector surface intersection         ● C++       ☆ 4       ▲ MPL-2.0       ♀ 4       ④ 5 (3 issues need help)			
traccc Public Demonstrator tracking chain on accelerators			

Designing **STL-like containers** and memory manager for both CPU and GPU <u>See S. Swatman's talk at ACAT21</u>

Geometry navigation **without runtime polymorphism** based on indiced surfaces (boundaries, transformations, material...)

See J. Niermann's talk at ACAT21

DESY is actively invovled: G. Mania, N. Styles

#### **ACTS R&D: Machine Learning-based tracking**

- ML is widely deployed in tracking domain
  - GNN for track finding (e.g. <u>Exa.TrkX</u>)
  - Evolutionary algorithm for parameters tuning
  - DNN based track classification
  - KNN for surface prediction
- The microsoft <u>ONNX</u> plugin was implemented in ACTS to allow deployment of ML solutions
  - Implementation of GNN in ACTS is being discussed





- Tracking will be more challenging at the HL-LHC era and other future particle and nuclear physics experiments
- ACTS is preparing a modern performant generic tracking software for this
- Growing interest from nuclear and particle experiments (utilized by >10 experiments)
- Active R&D lines within ACTS to accommodate the new computing landscape
- Outlook
  - There are still tools to develop and optimize in ACTS
  - Interplay with experiment frameworks is the key to make a real generic toolkit

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

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



acts-developers@cern.ch acts-users@cern.ch acts-parallelization@cern.ch acts-machine-learning@cern.ch



# **Backup**

#### **ACTS magnetic field**

- Magnetic field interfaces:
  - Constant magnetic field
  - Interpolated magnetic field
    - Calculates an interpolated B field value from a grid of known field values
  - Analytical solenoid magnetic field
    - Calculates field vectors analytically



- Magnetic field access:
  - Cache of field value make the access less expensive
  - To ensure thread-safety, the field cell is cached by client and passed between client and magnetic field service via client function argument

ATLAS Magnetic field in ACTS



#### **Material description**

Material effects need to be considered in tracking

Surface mapping for e.g. Silicon:

- Mapping material to discrete binned surfaces
- Material is considered when surface is crossed

#### X0 ratio Validation/Geantino vs $\eta$ for ITk



Volume mapping for e.g. Calorimeter:

- Mapping material to 3D volume grid points
- Material considered at each propagation step

## X0 ratio Validation/Geantino vs $\eta$ for a dummy Calorimeter



#### **Concurrency and parallelization in ACTS**

- ACTS is designed to support both inter- and intra-event parallelization
  - Stateless and const-correct tools
  - Contextual data design to support concurrent event execution with multiple conditional data on flight
    - Calibration, alignment and Magnetic field data
  - Concurrent code execution tested within unit and integration test suites

## Efficient CPU utilization even with contextual geometry



arXiv:2106.13593v1

#### Integration of ACTS into experiment software



#### The detectors used for development

r [mm]

The TrackML detector





## The non-linearity in tracking

- The (extended) KF used in HEP is optimal for linear system
- Tracking precision is degraded by significant non-linear effects with large incident angle





#### **ACTS Track parameter propagator interface**

#### Integrating particle transport & geometry navigation

Highly-templated design emphasizing on speed and customizability



## **ACTS application example: Muon Collider**



Great potential for discovery in the multi-TeV energy range!

EW measurement, Higgs couplings, new resonances DM search ...

Muon Collider Detector

Hit density is 10x HL-LHC due to Beam Induced Background (BIB)



Fit Library	Execution Time
ACTS	0.5 ms / evt
iLCsoft	100 ms / evt