# Track and Vertex reconstruction in ATLAS for LHC Run-3 and High-Luminosity phases

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## Tracking challenges at LHC

- Tracking is a key ingredient of reconstructing the full event
   → Used in almost every element of reconstruction
- Tracks need to be reconstructed
  - With very high efficiency, with precise track parameters, at very low fake rate, quickly
- Increase in number of interactions per bunch crossing implies an increase in number of charged particles per event
  - In Run-3 each collision is expected to produce up to  $O(10^4)$  hits
  - $\rightarrow$  **Complex combinatorial problem** for tracking whose difficulties increase with pile-up
  - It is challenging to maintain high quality of reconstructed tracks under high pile-up
    - High cluster density → incorrect cluster-to-track association
       → incorrect estimation of track parameters
    - Increase of clusters  $\rightarrow$  increase in fake contribution
    - CPU for tracking rapidly increases with pile-up







Primary vertex Pile-up removal reconstruction

Jet flavour tagging



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## ATLAS Inner Detector

- Designed to reconstruct charged particles up to  $|\eta|{<}2.5$ 
  - Three different detector technologies:
    - Silicon pixel detectors
      - Insertable B-layer (IBL) added before Run-2 and designed to improve precision and robustness
    - Semiconductor Tracker (SCT): silicon strip detectors
    - Transition Radiation Tracker (TRT): gas-filled straw tubes
- Surrounded by a thin superconducting solenoid providing 2 T axial magnetic field





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R1150.

**R1066** 

R563

R514

R443

**B371** 

R122. R88.5 R50.5 R33 5

Radius(mm)

## Track Reconstruction in ATLAS ATL-PHYS-PUB-2021-012

#### • Primary Tracking (INSIDE-OUT) → prompt tracks

- Formation of seeds from 3 silicon hits
- Combinatorial Kalman filter extends seeds in search roads and builds track candidates
- Assignment of clusters to competing tracks based on scoring algorithm
  - NN based algorithm to judge if a cluster has to be split among track candidates
- Final fit using a global- $\chi 2$
- Extension to TRT and re-fit to improve momentum resolution and particle identification
- Back-Tracking (OUTSIDE-IN) → particles produced at larger distance from beamline (mainly electrons from photon conversion)
  - Track reconstruction in regions of interest seeded by deposits in EM using only left-over hits from prior passes
  - Segments of TRT hits extended towards the interaction point using same procedure as primary tracking to build track candidates
  - Dedicated ambiguity resolution and final track fit
- Additional tracking passes use left over hits from prior passes
  - $\,\circ\,\,$  Tracklet from muons at  $|\eta|{>}2.5$  and short tracks
  - Non-pointing tracks from displaced decays, aka large-radius tracking (LRT) (not in standard reconstruction in Run-2)



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## Software optimisation for Run-3 ATL-PHYS-PUB-2021-012

- Number of changes to the tracking software to ensure that computational performance and size of the output remain sustainable during LHC Run-3 data-taking
  - $\rightarrow$  Best handle is to **abort track reconstruction as early as possible** for low quality candidates to reduce time and resources of down-stream algorithms  $_{-100}$
  - Stricter tracking cuts
    - At least 8 hits and  $\left|d_{0}\right|<5~mm$
  - Back-tracking and TRT optimization
    - Using RoIs seeded by EM deposits with  $E_{\rm T}{>}6~\text{GeV}$
  - Seed and pattern recognition tuning
    - Stricter requirements on seeds, narrower search roads, restriction of number of overlapping seeds
    - Seed confirmation from 4th layer and smaller seed formation regions
  - General optimisation of software implementation
    - Inclusion of ACTS-based vertexing



#### $2 \times 4$ improvement (at $\langle \mu \rangle = 90$ ) in speed is achieved since the beginning of the optimisation process!

## Summary of Performance Improvements

- Run-3 reconstruction is over x2 faster with a 25% reduction in the disk space
  - Timing of the pattern recognition reduced by a x4 (!)
  - Significantly **improved scaling with pile-up**  $\rightarrow$  capable of running up to high  $\langle \mu \rangle$  without major slowdowns
- Allows for the inclusion of LRT by default, while still meeting the targeted CPU and disk goals
  - Previously run separately on only a subset of data → exciting prospects ahead for long-lived particle searches!





- Performance improvements are largely thanks to a **reduction in the fake rate** 
  - Number of real tracks expected to scale linearly with µ, while random combinations expected to scale with a higher power
- No significant impact on the reconstruction efficiency
  - $\circ$  <4% (1%) at low (high) p<sub>T</sub>

## Vertex Reconstruction for Run-3 ATL-PHYS-PUB-2019-015

- ATLAS developed new vertex reconstruction strategy for Run-3 to improve efficiency and pile-up robustness
  - Recommissioning of Adaptive Multi-Vertex Finder and Fitter (AMVF) instead of Iterative Vertex Finder (IVF)
    - Use of Gaussian Track Density Seed Finder
    - Tracks for vertex fitting are associated to seed according to impact parameter significance and constrained to the seed position in z
    - Tracks share weights with multiple vertices, which are fit simultaneously
  - Better overall vertex reconstruction efficiency
    - Improves the already-high efficiency for  $t\bar{t}$  and recovers half the inefficiency for VBF  $H \rightarrow 4\nu$
    - Less dependence of reconstruction efficiency on pile-up
    - Improved longitudinal separation
      - □ 20% (10%) better resolution for  $t\bar{t}$  (VBF H→4 $\nu$ )
  - In addition, ACTS-provided implementation of AMVF
    - Brings a 40% reduction in the CPU timing





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## Upgrade of the ID for HL-LHC: ITk

- More challenging data-taking conditions at HL-LHC:  $\overset{\underline{\mathbb{E}}}{\underline{\mathbb{L}}}$  $\mathcal{L}=7,5\times10^{34}$  cm<sup>-2</sup> s<sup>-1</sup>,  $\langle\mu\rangle\approx200$ , for 4000 fb<sup>-1</sup>
- ITk (Inner Tracker) is a full replacement of the ATLAS ID
  - "all-silicon" detector, new pixel and strip detectors
- Extended tracking acceptance: up to |η|~4
  - Improved sensitivity and acceptance in VBS, VBF Higgs studies, bbH, H  $\rightarrow$  4l, etc.
  - $\circ~$  Pile-up jet suppression  $\rightarrow$  Improved MET resolution
  - Better identification of the hard scatter vertex
  - Improved identification or suppression of b-jets
  - Increased range for lepton reconstruction



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- $\rightarrow$  4 strip **barrel layers** and 6 **end-cap** discs
- $\rightarrow$  5 pixel **barrel layers** and inclined and vertical **rings** 
  - reduced innermost radius: flat layer (inner radius
- of rings) at 34 (33.2) mm [IBL: 33.25 mm]
- $25x100~\mu m^2$  pixels for flat innermost layer and  $50x50~\mu m^2$  elsewhere [IBL:  $50x250~\mu m^2$ ]

#### Tracking Performance with ITk Poster Session: Irina Ene ATL-PHYS-PUB-2021-024

- Excellent tracking performance despite the increased level of pile-up
  - $\circ~$  Tracking efficiency for tracks with p\_>1 GeV within the detector acceptance for  $t\bar{t}$  with pile-up
    - $|\eta| < 1.4$ : ITk detector ( $\langle \mu \rangle = 200$ ) is within 5% to the one of the Run 2 detector ( $\langle \mu \rangle = 38$ )
  - Very high purity tracks shown by linearity of number of reconstructed tracks as a function of number of interactions: negligible tracking fake rate  $(O(10^{-4}))$  in spite of the  $\langle \mu \rangle = 200$



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### Track Parameter Resolutions

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- Track parameter resolutions improved wrt current detector, thanks to the comparable radius of the innermost pixel layers and reduced pixel pitch (25×100 or 50×50 µm<sup>2</sup> for ITk, 50×250 µm<sup>2</sup> for the IBL)
  - $d_0$  and  $z_0$  resolutions improved by a x2 and x4, respectively
  - transverse momentum resolution outperforms Run-2
    - better resolution in the bending direction for silicon strip sensors, compared to TRT

## Vertex Reconstruction with ITk ATL-PHYS-PUB-2021-024

- Vertex reconstruction relies on **AMVF**, fitting all vertices simultaneously
  - Excellent vertexing performance and robustness against pile-up
    - High vertex reconstruction efficiency and improved longitudinal position resolution wrt ID



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## Conclusion

- Tracking algorithms need to provide high-quality tracks efficiently with an efficient use of resources
  - ATLAS provided excellent tracking and vertexing performance in Run-2
- Many **improvements** to get ready for the **challenging Run-3 data-taking** 
  - Surpassing x2 CPU speedup and 25% disk reduction, even with the added inclusion of LRT by default
- HL-LHC will provide unprecedented challenges in terms of track and vertex reconstruction
  - **Excellent performance** for tracking and vertex reconstruction for the **ITk** wrt the current detector despite the **increase in pile-up**

 Opens up a rich playground for future developments, using what we have learned so far as well as investigating new strategies

# Additional Slides



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## Run-2 vs Run-3 fraction of total CPU requirement





#### **ATL-PHYS-PUB-2021-012**

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#### Disk space: Run 2 vs Run 3 track reconstruction



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## IVF vs AMVF



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## Vertex Reconstruction and Selection Efficiency



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## Vertex Longitudinal Resolution





#### ATL-PHYS-PUB-2019-015

#### **Reconstructed Vertices**



# Alignment of the Inner Detector <sup>Eur. Phys. J. C 80 (2020) 1194</sup>

- Determination of detector geometry as accurately as possible and correction for time-dependent movements
  - Based on the minimization of track-hit residuals in a sequence of hierarchical levels
    - from global mechanical assembly structures to local sensors, with increasing numbers of degrees of freedom
  - Operational conditions affect the positions of ID elements
    - pixel detector moves upwards every time the data acquisition is activated, staves of the IBL bow depending on the temperature, while remaining structures are quite stable during LHC fill
  - $\rightarrow$  Automated alignment scheme for the ID
  - Dynamic alignment update throughout each LHC fill calibrating the recorded data
    - every 20 minutes during the first hour of data-taking; every 100 minutes for the rest of the fill



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## Tracking in Dense Environment

- In dense environment, multiple tracks get associated with one cluster
  - High-p T signatures (taus, jets)
- In ATLAS, Neural networks have been implemented to resolve those ambiguities
  - ∘ 3 NNs for (x,y) position (1,2 and ≥3 particle hits) + 2x3 for  $(\sigma_x, \sigma_y)$  uncertainties NNs
- Previous approach improved using algorithm based on Mixture Density Networks (MDN)
  - 9 NNs replaced with 3 MDNs: can estimate both hit position and associated uncertainty simultaneously





(b) Merged pixel cluster

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## Simulation and Track Reconstruction for ITk

- Updated and improved modeling of the Pixel and Strip Detectors in simulation
  - Support structures, services, patch panels in forward region, ...
- Updated description of modules and improved accuracy of digitization model





• Track reconstruction based on Run-2 ID software with requirements updated to ITk characteristics

Requirements	Pseudorapidity interval		
	$ \eta  < 2.0$	$2.0 <  \eta  < 2.6$	$2.6 <  \eta  < 4.0$
pixel + strip hits	≥ 9	$\geq 8$	≥ 7
pixel hits	≥ 1	≥ 1	≥ 1
holes	≤ 2	$\leq 2$	$\leq 2$
$p_T [MeV]$	> 900	> 400	> 400
$ d_0 $ [mm]	$\leq 2.0$	$\leq 2.0$	≤ 10.0
$ z_0 $ [cm]	$\leq 20.0$	$\leq 20.0$	$\leq 20.0$

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## Hermeticity check for ITk

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- Provide hermetic coverage with a minimum of 9 hits for primaries with p<sub>T</sub> > 1 GeV and z<sub>vertex</sub> = [-150, 150] mm
   → Strip+Pixel provide a total of 13 hits for |η| <2.6</li>
  - **11 hits** in the strip barrel/end-cap transition  $(|\eta| \sim 1.2)$
  - → The **pixel end-cap system** is designed for of at least **9 hits from**  $|\eta| > 2.7$  (except very close to  $|\eta| \sim 4$ )



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#### Tracking Performance with ITk Poster Session: Irina Ene ATL-PHYS-PUB-2021-024



- Tracking efficiency for different particle types with  $p_T=10$  GeV
  - >85% for any kind of prompt and stable charged particles
- Tracking efficiency as a function of pT for tt
   events with pile-up

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- Tracking efficiency shown for 2, 10 and 100 GeV muons
  - very compatible with the one obtained with the Run 2 detector for  $|\eta| < 2.4$
  - 0.5% reduction observed in the barrel for 2 GeV muons
    - expected to be recovered in future optimisations

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## Track Parameter Resolutions

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- At low  $p_{\mathsf{T}}$  dominated by multiple scattering effects
  - $\circ~$  Similar d\_0 resolution is achieved between the ITk and the Run-2 detector, thanks to similar innermost radius
  - z<sub>0</sub> resolution improved by up to a x2, thanks to the smaller pixel pitch used in the ITk pixel detector
  - Similar  $q/p_T$  resolution, improved thanks to the better precision of strip measurements wrt TRT

## Vertex Reconstruction with ITk ATL-PHYS-PUB-2021-024

- Number of interactions and local pile-up density distribution
  - The local pile-up density takes into account event-by-event fluctuations, by computing the number of pileup vertices in a small window (=+/-2 mm) around the hard-scatter vertex / the size of the window.





- Combined vertex selection and reconstruction efficiency is impacted by many effects:
  - Splitting of HS vertex into several reco vertices or merging of pile-up vertices reduced probability of selecting the HS vertex as the one with highest  $\Sigma p_T^2$ ; pileup interactions can genuinely produce a vertex with  $\Sigma p_T^2$  larger than simulated HS process
    - All effects correlated with number of interactions per bunch crossing → reduced selection and reconstruction
      efficiency with increasing pile-up

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## Jet Flavour tagging performance with ITk



- Improvement in low-level algorithms:
  - improved IP3D track categorisation exploiting p<sub>T</sub>.dependance of IP resolution in central region + hitcontent in forward region
  - material rejection for secondary vertices for SV1 + JetFitter
- Improved IP3D performance both
   from improved IP + track
   categorisation
- 40% improvement for MV2, driven by IP3D improvement
  - 20% higher light-jet rejection wrt Run-2 at 77% b-jet efficiency working poiny

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#### Fast Track Reconstruction For ITk

- We have seen CPU reduction thanks to layout optimisation and harder selection cuts for ITk wrt Run2 (based on Run2 tracking software): ATL-PHYS-PUB-2019-014
  - $\rightarrow$  Proven a fully functional software prototypes for fast reconstruction demonstrate that nearly offline quality track reconstruction performance can be reached within much reduced CPU resource requirements





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