

After final fit, track quality is assessed with

Removing hits of found tracks reduce the combinatorial problem so that problematic tracks can be reconstructed within the CPU time budget.



## (c) Tracking Performance using Tag&Probe Technique

- The tag and probe method (T&P) is a data-driven technique used to measure the efficiencies from data. It is based on the reconstruction of well-known resonances, such as Z boson.
  - Tag: a global muon (i.e. reconstructed using both the muon chambers and the tracker) with transverse momentum  $p_T \ge 27$ , associated to one leg of the resonance and with a single muon trigger.
  - > **Probe:** any standalone muon (i.e. reconstructed using only hits from the muon system) with at least one valid hit in the muon system (i.e. good track-hit  $\chi^2$ ).
  - > passing probe: The standalone muon is matched with tracks that fulfill minimum quality requirements in ( $\Delta$  R < 0.3). The matching is defined by comparing the directions at the point of the closest approach to the beamline of the two tracks.
- The (tag + passing probe) and (tag + failing probe) lineshapes are fit separately with a signal + background model.
  - The efficiency is computed as the ratio between the "passing probes" and the total number of probes in the sample.



multiple levels using Kalman Filter, using the mkFit algorithm [2].

vectorization at

and

## track classifier: from a Boosted Decision Tree to a Deep Neural Network [3].



The tracking fake rate using **mkFit** is lower than. the one obtained with the traditional CKF tracking algorithm Using **mkFit** allows to reduce the track building time by a factor of about 3.5 considering the sum of iterations where mkFit is used.

Parallelization

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The tracking fake rate when the DNN is used is lower than the one obtained using the BDT across all the radii values, with a reduction of about 30%.

- Since the start of Run 3, the HLT makes use of a heterogeneous computing farm to run a version of the full event reconstruction optimized for fast processing.
- In Run 3, HLT tracking is based on a single iteration of the Combinational Kalman Filter, seeded by pixel tracks reconstructed by the Patatrack algorithm [4], which can be offloaded to GPUs.

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Tracking Fake

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Muon tracking efficiency calculated from  $Z \rightarrow \mu + \mu$ - events using Tag-and-Probe technique for the subset of trajectories in which the CMS tracker is used to seed the measurement (**Tracker-only seeded tracks**) [6],[7].

The final reconstructed tracks include outside-in and more relaxed inside-out regional muon iterations iterations higher efficiency for muons.



Muon tracking efficiency calculated from  $Z \rightarrow \mu + \mu$ - events using Tag-and-Probe technique for all reconstructed muon

Simulated Track  $\eta$ 

Track η

Simulated Track  $\eta$ 

The tracking efficiency (left), tracking fake rate (middle), and the track  $d_{xy}$  resolution are shown as a function of the simulated track pseudorapidity  $\eta$  for the Run-2 HLT tracking (blue) and the Run-3 HLT single-iteration tracking (red) [5]. With respect to the Run 2 HLT tracking, improved efficiency, improved impact parameters resolution, and noticeable fake rate rejection in the transition region between the barrel and the endcap.

## Performance of tracking @ HLT

- The performance is measured using runs taken shortly before and after the first Technical Stop (TS1) of the LHC, when several updates in detector conditions took place:
- Increase in BPix L1 reverse bias high voltage (HV) from 150 V to 300 V.
- Update of the pixel cluster position estimator (CPE), as well as a new pixel detector gain calibration and a new tracker alignment.
- The HLT tracking efficiency and fake rate measured in data are defined with respect to offline tracks, i.e. tracks produced by the full offline event reconstruction, which satisfy high-purity track quality criteria [9].
- ✓ Differences in efficiency over the full η range are due to differences in efficiency in BPix L1 [9].





## trajectories (All-tracks). [6],[7].

Thanks to the phase-1 pixel upgrade (adding one more layer of pixel measurements) and the new track seeding algorithm *based on Cellular Automaton (CA) technique* ⇒ increased efficiency after 2016

(\*) old APV settings: pre-amplifier of the APV25 readout chip is saturated (20 fb-1 of 2016 data). new APV settings: APV setting changed for fast recovery (16 fb-1 of 2016 data) [8].



□Despite the challenging conditions at the LHC in Run 2 and in Run 3, the CMS Tracker has robust performance in a challenging environment ⇒ "high tracking and vertexing performance".

- Performances show a dependence of the detector as well as the algorithms used in the event reconstruction.
- The Phase-1 pixel upgrade has helped to cope with higher LHC delivered luminosity and the increased number of PU events during Run 2.
- In order to provide more precise and accurate track reconstruction sophisticated algorithms, techniques and calibrations have been developed for Run 3 which helped to cope with the excellent tracking efficiency.

✓ The increase in fake rate at high |η| is also observed in the HLT tracking performance with respect to simulation [5].





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