

# Fast Simulation at LHCb

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Adam Morris, on behalf of the LHCb Collaboration

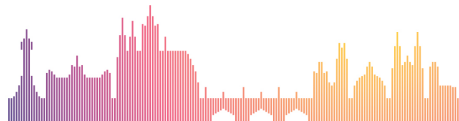
HISKP, University of Bonn

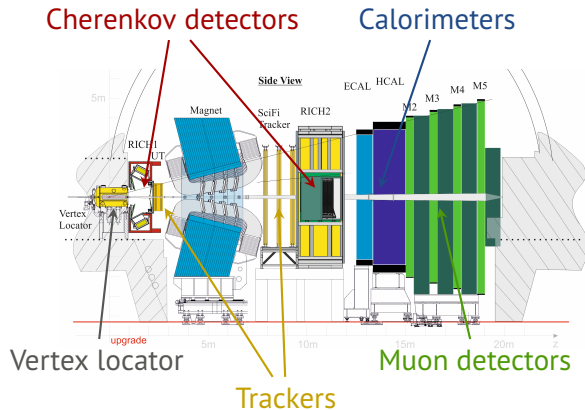
40<sup>th</sup> International Conference on High Energy Physics

Prague, 29<sup>th</sup> July 2020

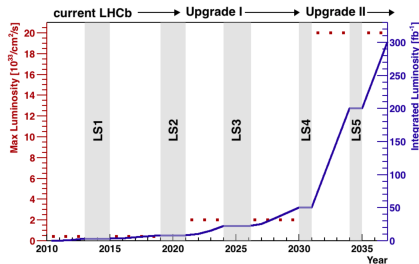


UNIVERSITÄT



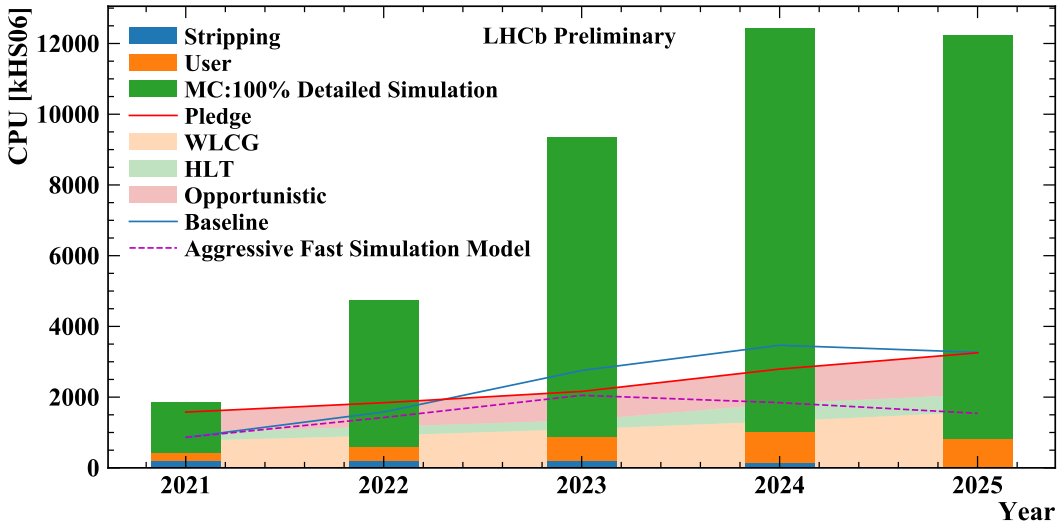


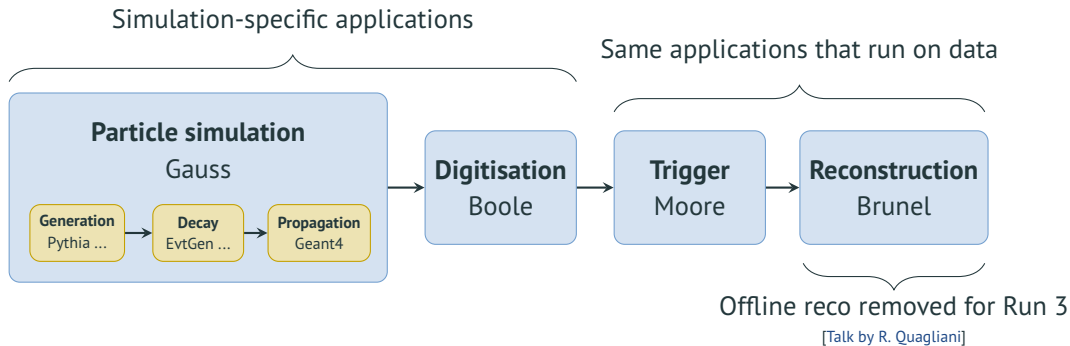
Detector paper: [JINST 3 (2008) S08005]  
[Talk on upgrade by F. Alessio]

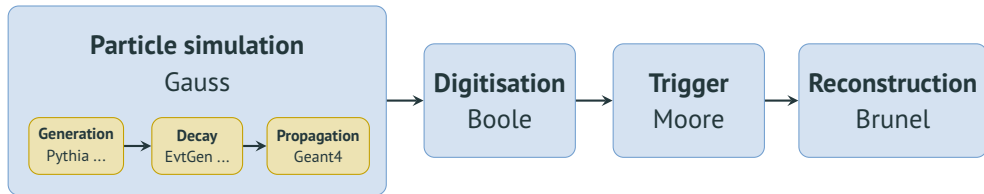


[LHCb-PUB-2018-009]

- Already a need for large MC samples for certain Run1+2 analyses.
- Increased luminosity in Run 3: more numerous and complex events.





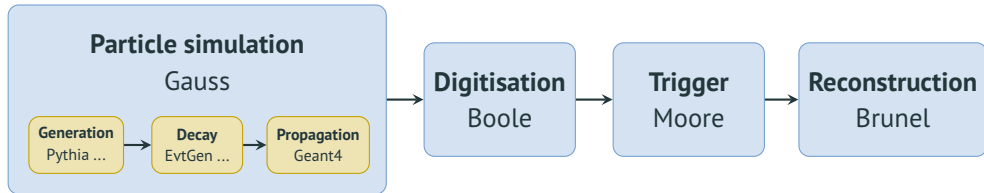


95 – 99% of CPU time for  
whole chain spent in Geant4

How can we speed this up?

- Code optimisation
- Multithreading
- ...

Selective simulation  
(ReDecay, PGun, SplitSim)



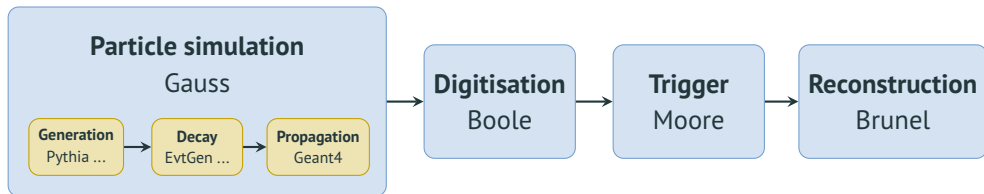
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- Simulate fewer particles

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Disable subdetectors  
(RICHless, Tracker Only)



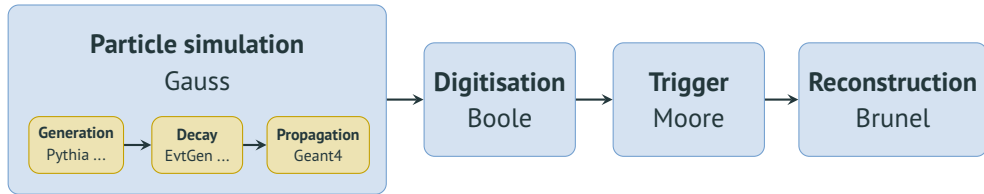
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- Simulate less of the detector

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Parametric methods  
(Lamarr, Fast CALO...)

95 – 99% of CPU time for  
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How can we speed this up?

- Code optimisation
- Multithreading
- Simulate fewer particles
- Simulate less of the detector
- Faster subdetector simulation



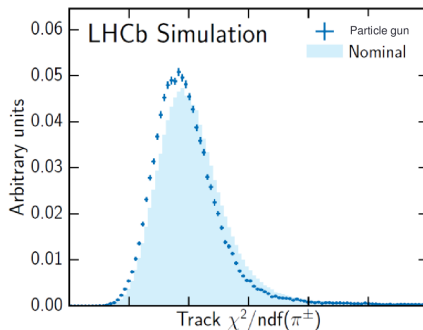
## Growing menu of fast simulation options

Method	Step sped-up					
	Generation	Decay	Propagation	Digitisation	Trigger	Reconstruction
ReDecay	✓	✓	✓			
PGun	✓	✓	✓			
SplitSim	✓		✓			
RICHless			✓			
TrackerOnly			✓			
Lamarr			✓	✓	✓	✓
FastCALO*			✓			

\* [Separate talk by M. Rama]

In production

- Only generate the signal particles without underlying event
- Primary vertex smearing applied in reconstruction
- ✓ Roughly 50 – 100× faster
- ✓ About 1% of the disk usage
- Useful for quick checks, but limited suitability for physics analysis
  - ✓ Good for Central Exclusive Production
- ✗ No information from underlying event
- ✗ Poorly reproduces variables affected by local occupancy



[LHCb-TALK-2018-302]

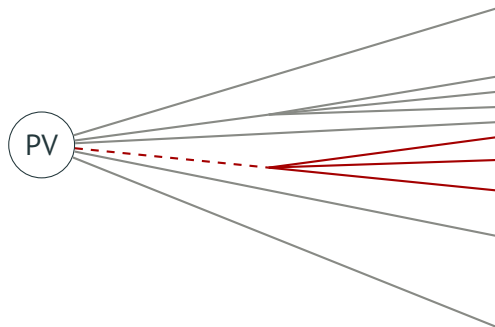
[EPJC (2018) 78:1009]

In production

Idea: use the same underlying event for many signal decays.

Method:

- Generate a full event
- Delete signal decay but save production kinematics
- Generate  $N$  signal decays and merge with underlying event



Configurable:

- $N$  decays (typically 100)
- What to re-decay (signal only, heaviest ancestor, all heavy flavour, ...)

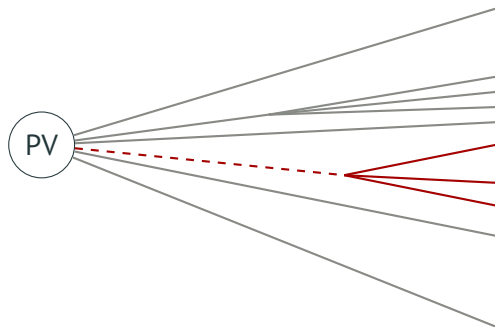
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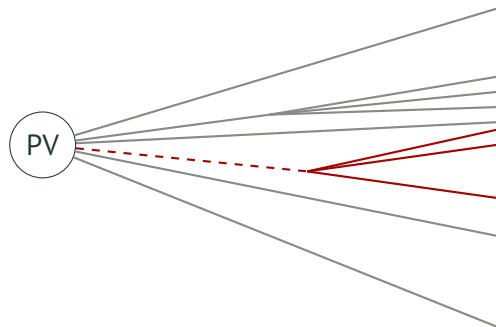
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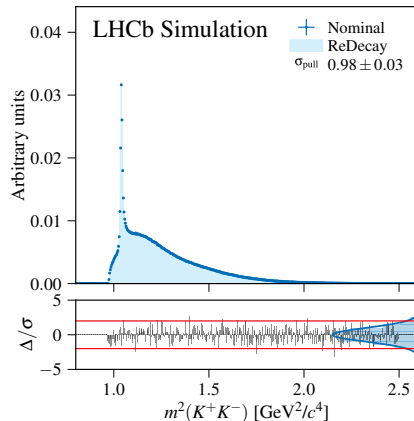
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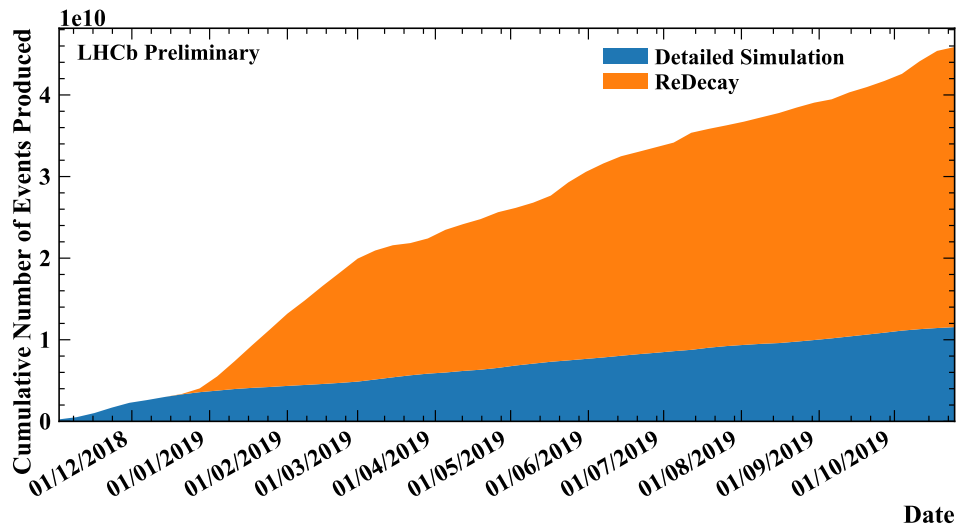
Configurable:

- $N$  decays (typically 100)
- What to re-decay (signal only, heaviest ancestor, all heavy flavour, ...)

- ✓ Independent of choice of generator
- ✓ Can be combined with other fast simulation options
- ✓ Speed-up simulation by  $10\times$  to  $50\times$
- ⚠ Loss of statistical independence between events
  - Statistical uncertainties  $\geq \sqrt{N}$  depending on type of variable
  - ✓ LHCb usually deals with properties of signal decays re-generated for each event
  - Proper statistical treatment with block-bootstrapping
- ✗ Only suitable for generating specific decays (not *e.g.* min bias)



[EPJC (2018) 78:1009]

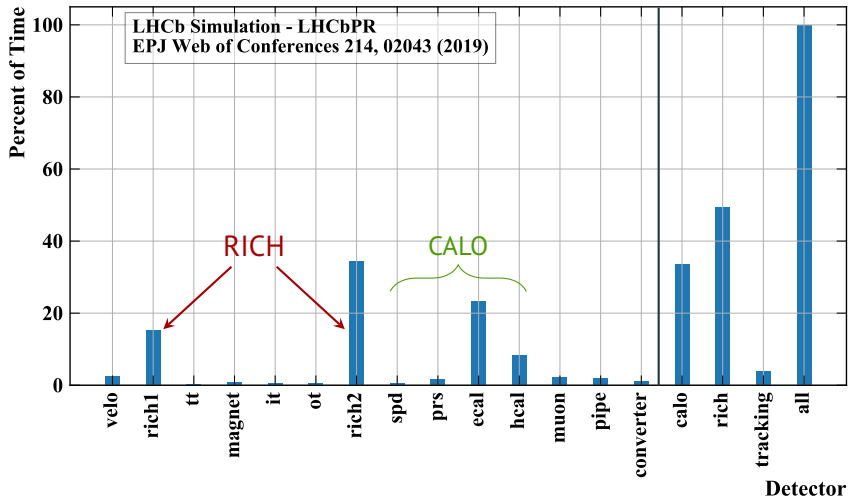


[LHCb-FIGURE-2019-018]

In production

- Simulate part of the event before deciding whether to simulate the rest of it
- Similar splitting/merging technique to ReDecay
- More efficient filtering on material interactions or particles decayed by Geant4
  - Converted photons  $\gamma \rightarrow e^+ e^-$
  - Rare decays of  $K_S^0$

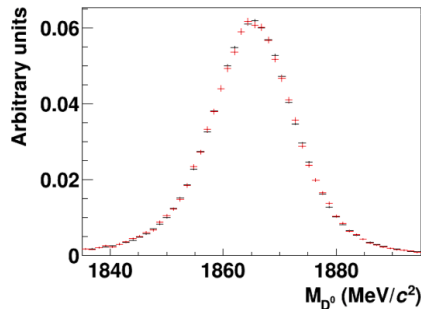




Detector simulation dominated by Cherenkov (**RICH**) detectors and calorimeters (**CALO**) 10

In production

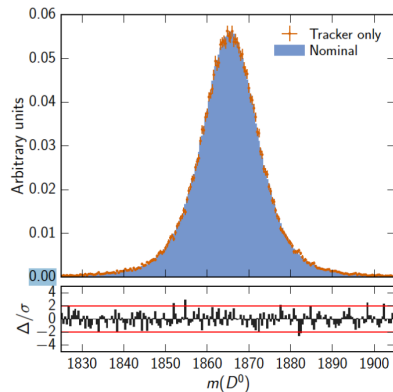
- Disable generation of optical photons in the RICH
- Interaction with RICH material still simulated
  - ✓ No impact on downstream detectors
- ✓ Roughly 30% speedup
- ✓ Slight reduction in disk usage
- ⚠ No simulated hadron PID
  - Existing parametric techniques (*e.g.* PIDCalib<sup>[LHCb-PUB-2016-021]</sup>)
- ✗ Requires special trigger and offline selection



[LHCb-TALK-2018-302]

In production

- Disable RICH optical photons
- Remove CALO and MUON entirely
- ✓ Roughly 10× speedup
- ✓ Roughly 25% disk use
- ✗ No PID at all
- ✗ No hardware trigger simulation



[LHCb-TALK-2018-302]

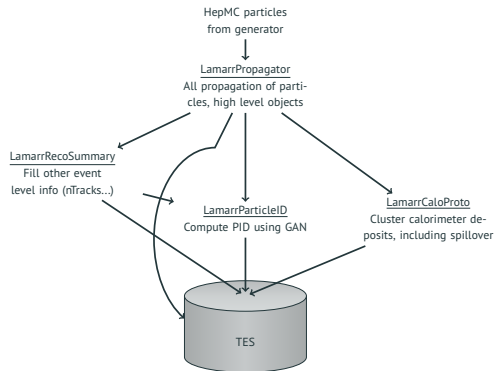
Replace propagation, digitisation and reconstruction with fully-parametrised detector.

Existing tool: Delphes<sup>[JHEP 02 (2014) 057]</sup>

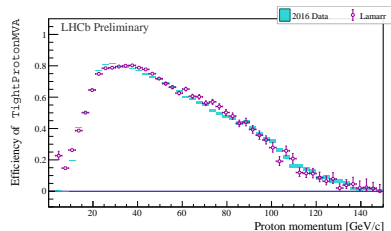
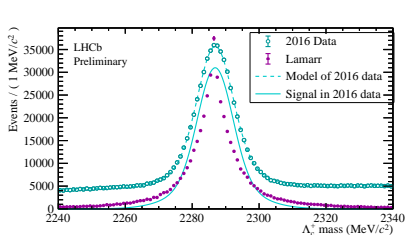
- LHCb geometry not natively supported
  - Implemented dipole magnet
  - Implemented cartesian calorimeter segmentation
- Interfacing with Gauss required extra steps
- Review found duplications and complications of event processing frameworks
- Decided to proceed with in-house parametrised detector simulation: **Lamarr**
- LHCb implementation will be pushed upstream to Delphes for use in HEP community

In development

- Propagate MC particle to all points of interest, then smear and apply efficiencies
- Sample track info with Inverse Cumulative Method
- Calorimeter parameterisation using simple loops on geometries, inspired by studies with Delphes
- Stacked GANs for PID
- Output is high-level objects used in physics analysis

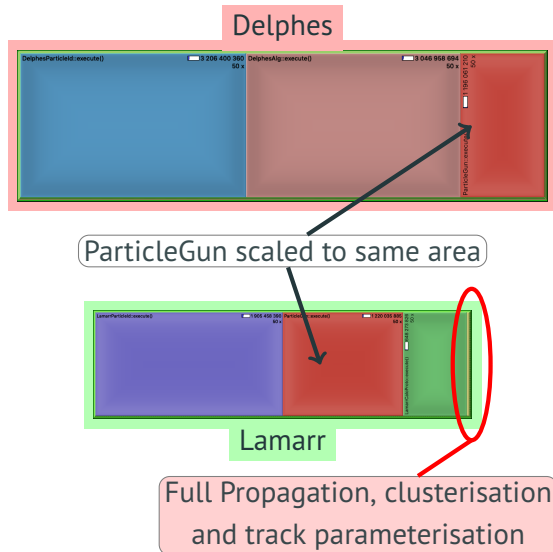


- ‘Out-of-the-box’ output compared with 2016 data
- Example:  $\Lambda_b^0 \rightarrow \Lambda_c^+ \mu^- \bar{\nu}_\mu$ ,  $\Lambda_c \rightarrow p K^- \pi^+$
- Further refinements ongoing



[LHCb-FIGURE-2019-017]

- Run Valgrind with Cachegrind on 50  $B^0 \rightarrow K^+ K^- \pi^0 (\rightarrow \gamma\gamma)$  events with both Delphes and Lamarr setup
- Propagation and high level particle making is tiny sliver on Lamarr graph
- Future improvements focus on:
  - TensorFlow memory management
  - Multithreaded random generators for calorimeter clustering



- ⚠ Fast simulation an absolute necessity to meet future simulation demands
- ✓ Growing suite of techniques and improvements
  - ✓ Complementary options that can be combined
  - ✓ Successful adoption and widespread use of several techniques already
  - ✓ Several more on the horizon
- Stay tuned for Matteo's talk on fast calorimeter simulation

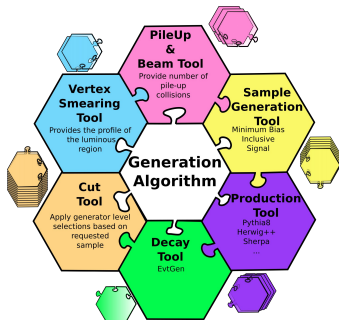


Backup slides

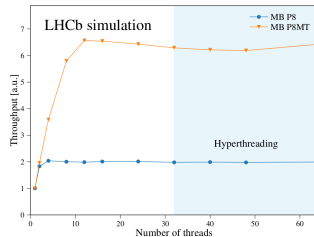
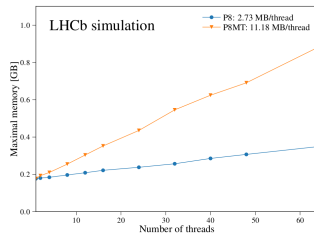
[LHCb-PROC-2019-010]

## Experiment-independent core simulation framework

- Built on Gaudi using its task-based parallelism
- Modularity inspired by Gauss
- Multithreaded generation and simulation phases



In development

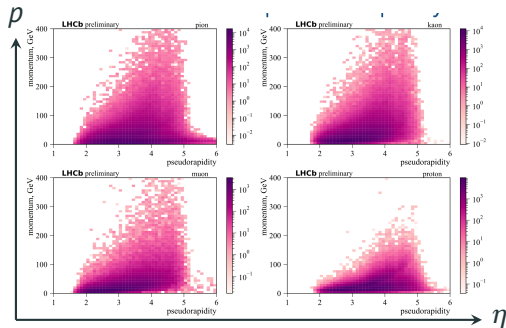
Thread-local Pythia8 configuration  
Shared Pythia8 configuration

# RICH response with generative adversarial network

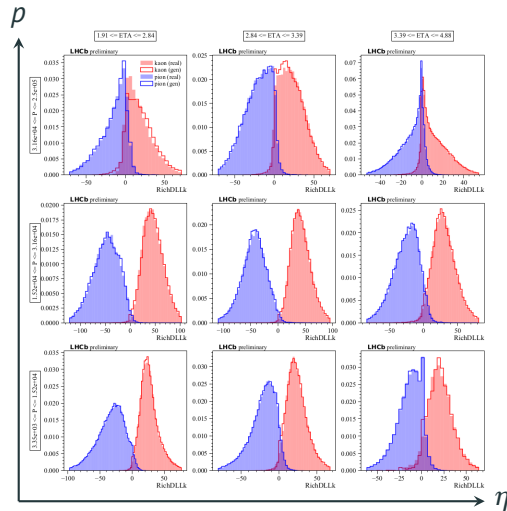
[CHEP 2019 proceedings]

- Learn PID response given only particle type and kinematics
- Based on Cramer GAN
- Trained on calibration data

In development



Calibration data



Generated vs actual  $\Delta_{LL} K$  response for pions and kaons

