

Allen: A High Level Trigger on GPUs for LHCb

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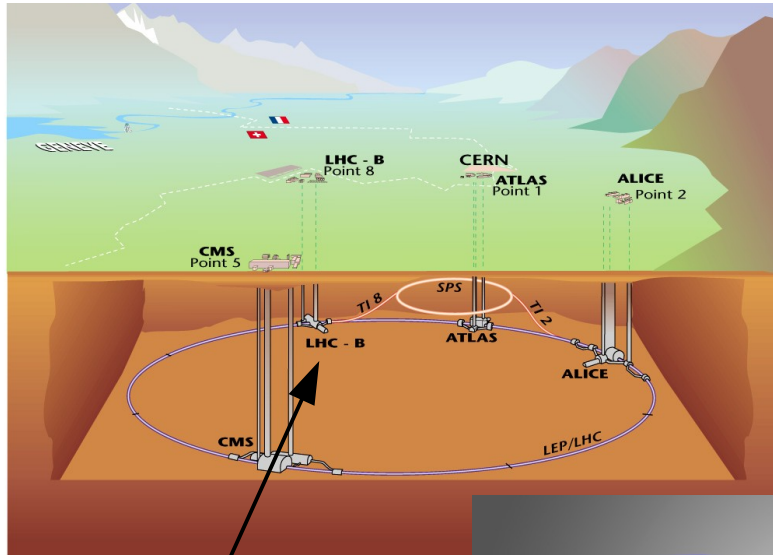
January 27th 2020

LPNHE seminar

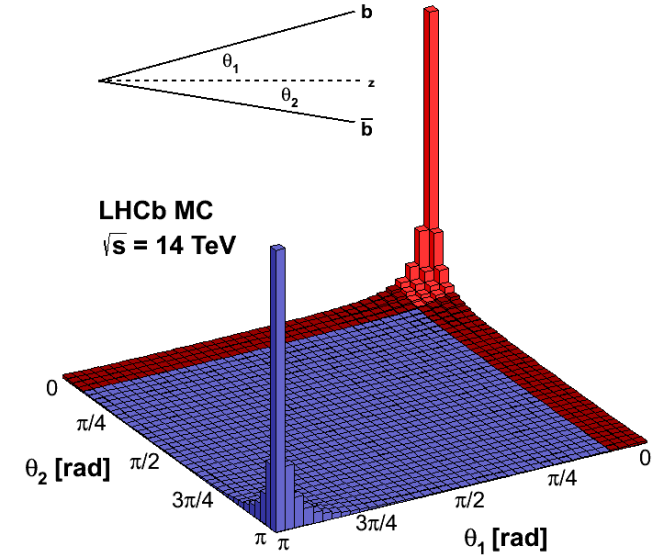
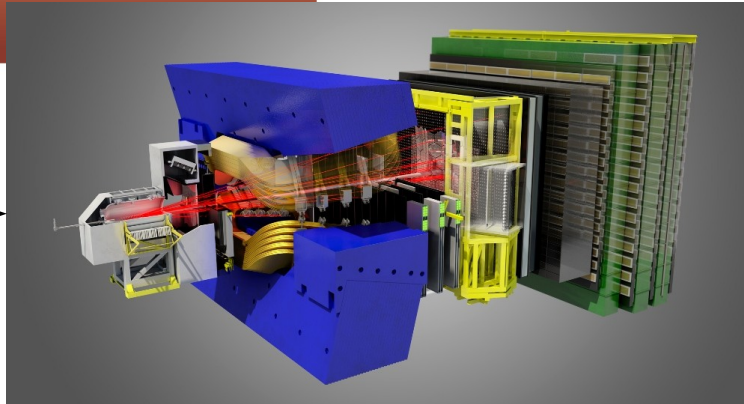


LHCb

LHC @ CERN



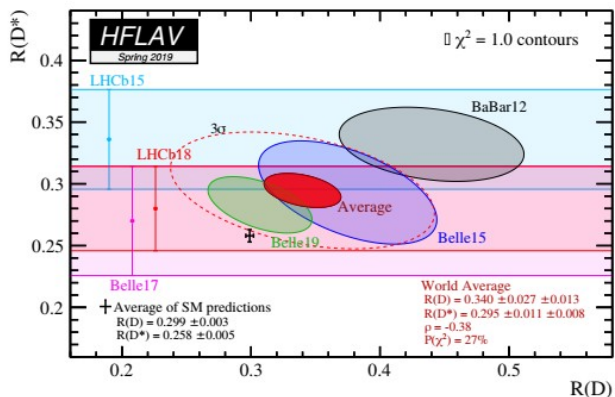
General purpose detector in the forward region
specialized in beauty and charm hadrons



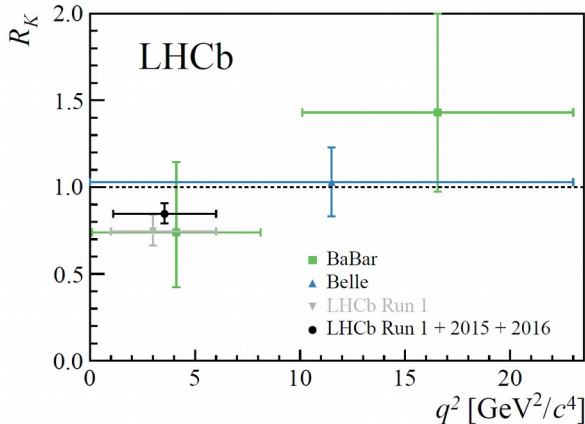
Highlights from Runs 1 & 2

Lepton flavor universality

$b \rightarrow cl\nu$

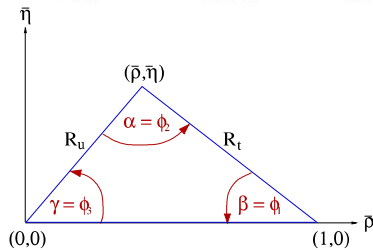
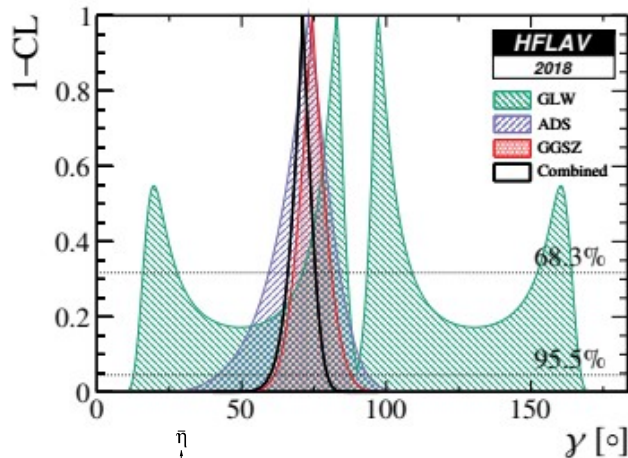


$b \rightarrow sl^+l^-$

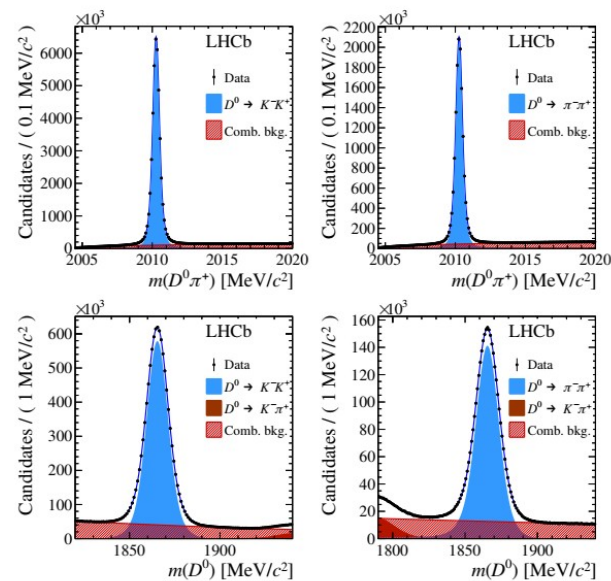


T. Humair, Moriond 2019

Constraining CKM angles

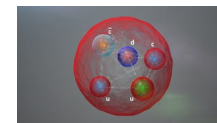
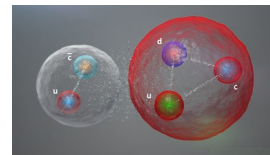


CP violation in charm decays



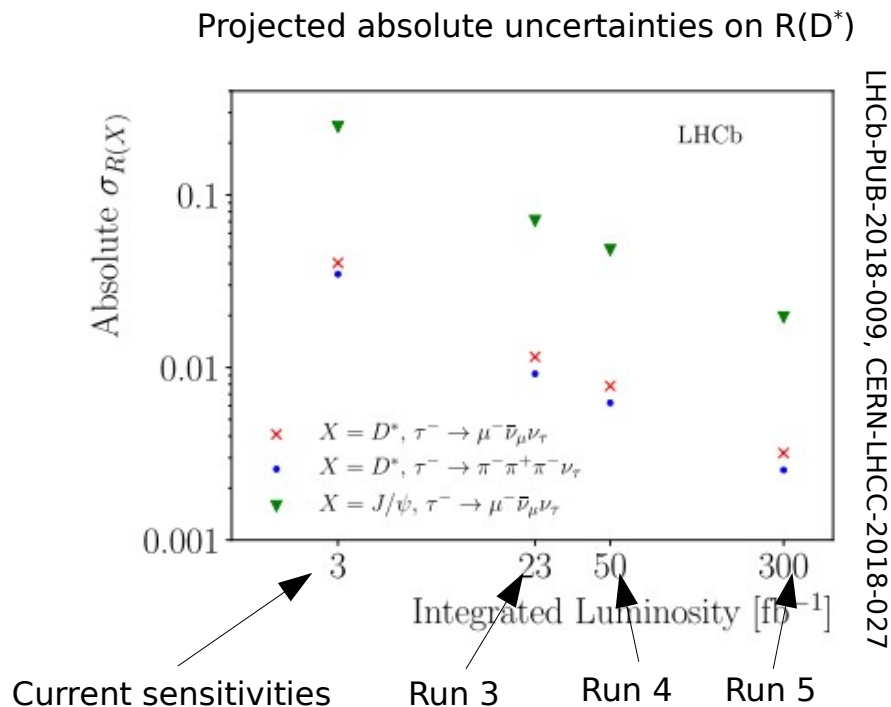
Phys. Rev. Lett. 122, 211803 (2019)

Pentaquarks

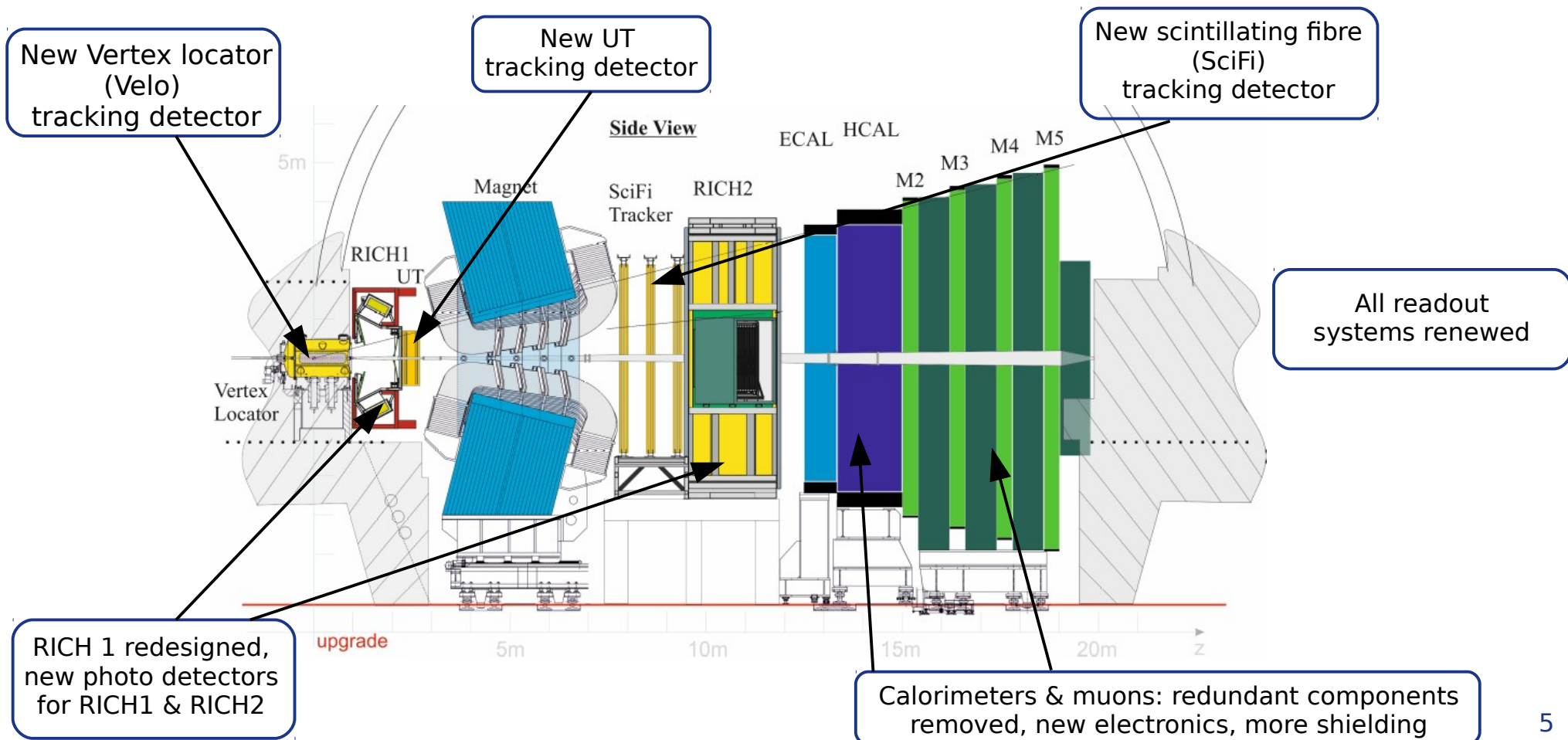


Prospects for Run 3 (2021)

- Crucial to reduce uncertainties
→ manifestation of new physics?
- $R(D^*)$ is theoretically clean
→ reduction of statistical uncertainty necessary
- Runs 3 and beyond will shed light on the flavour anomalies currently observed

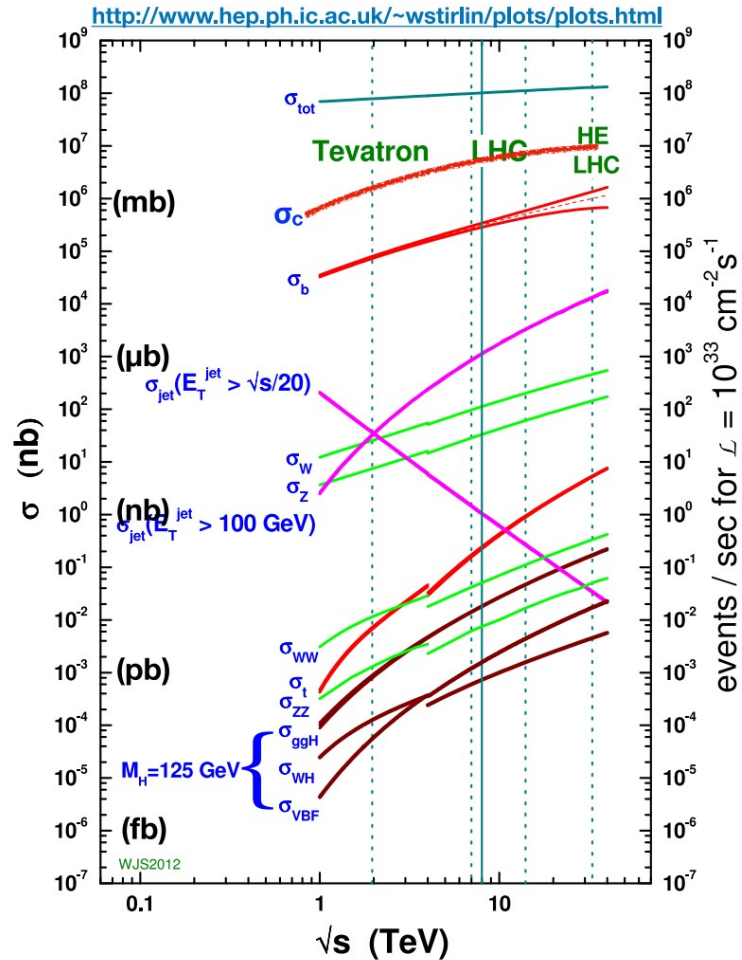


LHCb upgrade for Run 3 (2021)



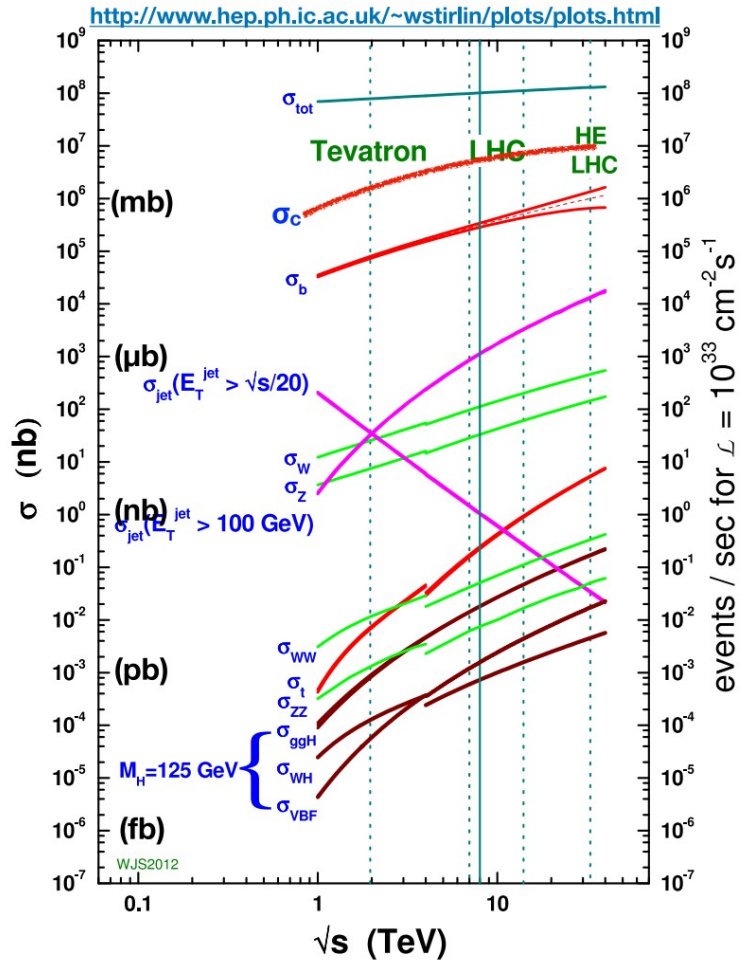
Reaching the MHz signal era

Run 3: Luminosity of $2 \times 10^{33} \text{ cm}^{-2} \text{ s}^{-1}$, $\sqrt{s} = 14 \text{ TeV}$



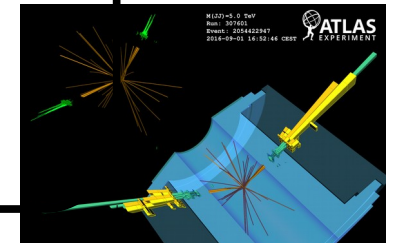
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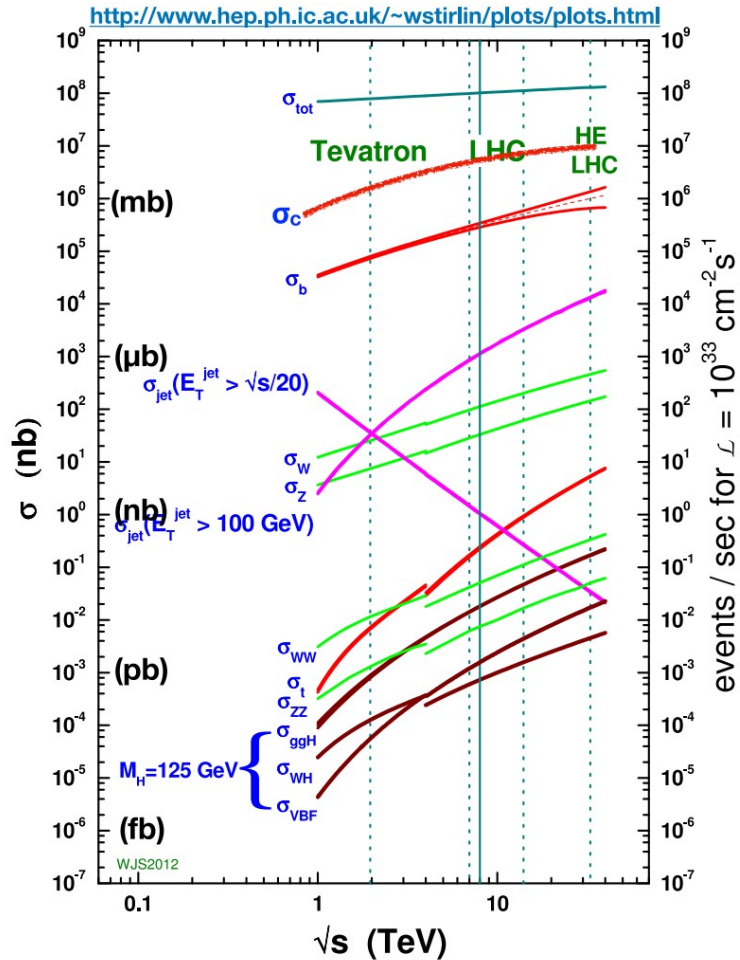
events / sec for $\mathcal{L} = 10^{33} \text{ cm}^{-2} \text{ s}^{-1}$

- General purpose LHC experiments: jets, electro-weak physics, Higgs physics
- Local characteristic signatures, e.g. high transverse energy
- Can trigger efficiently at $\sim 100 \text{ kHz}$
→ hardware-level trigger possible



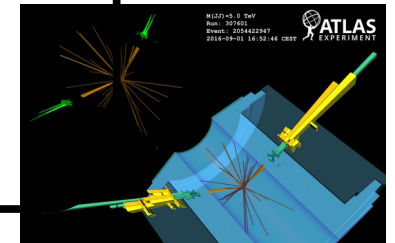
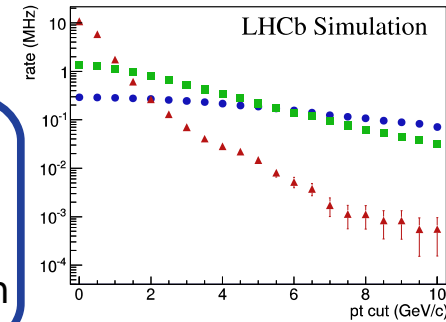
Reaching the MHz signal era

Run 3: Luminosity of $2 \times 10^{33} \text{ cm}^{-2} \text{ s}^{-1}$, $\sqrt{s} = 14 \text{ TeV}$



- Too many interesting events
- No “simple” local criteria for selection
→ hardware-level trigger not an option

- General purpose LHC experiments: jets, electro-weak physics, Higgs physics
- Local characteristic signatures, e.g. high transverse energy
- Can trigger efficiently at $\sim 100 \text{ kHz}$
→ hardware-level trigger possible



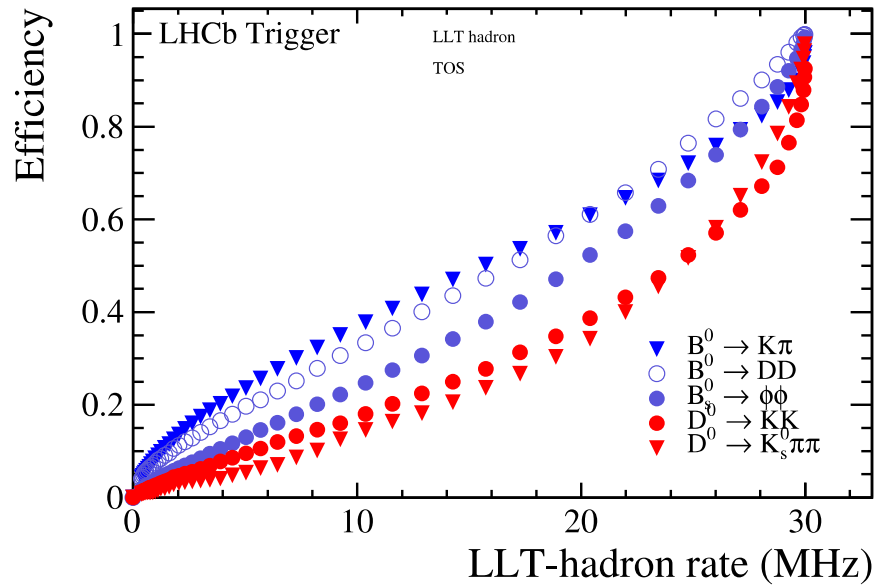
Change in trigger paradigm



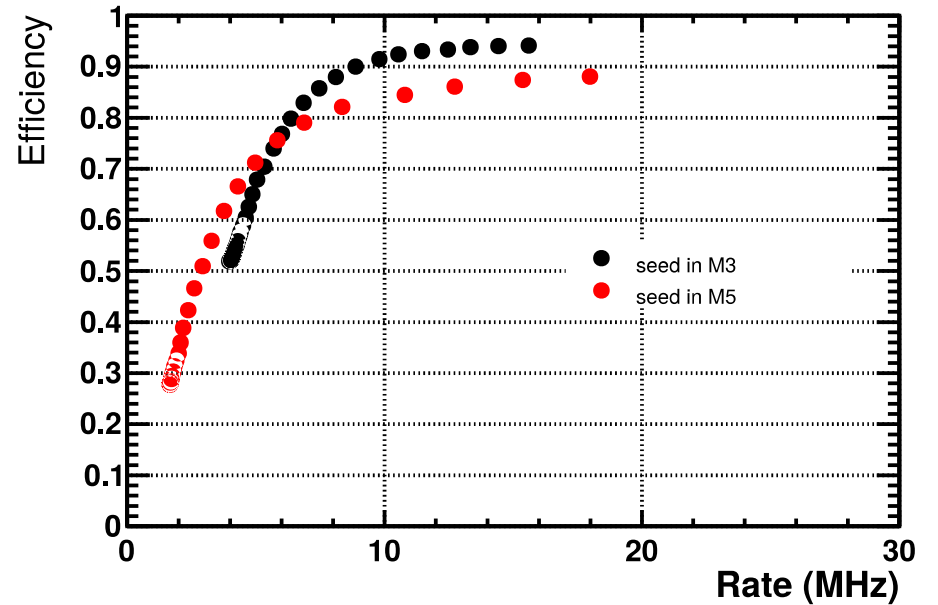
Access as much information about the collision as early as possible

Why no low level trigger?

Low level trigger on E_T from
the calorimeter

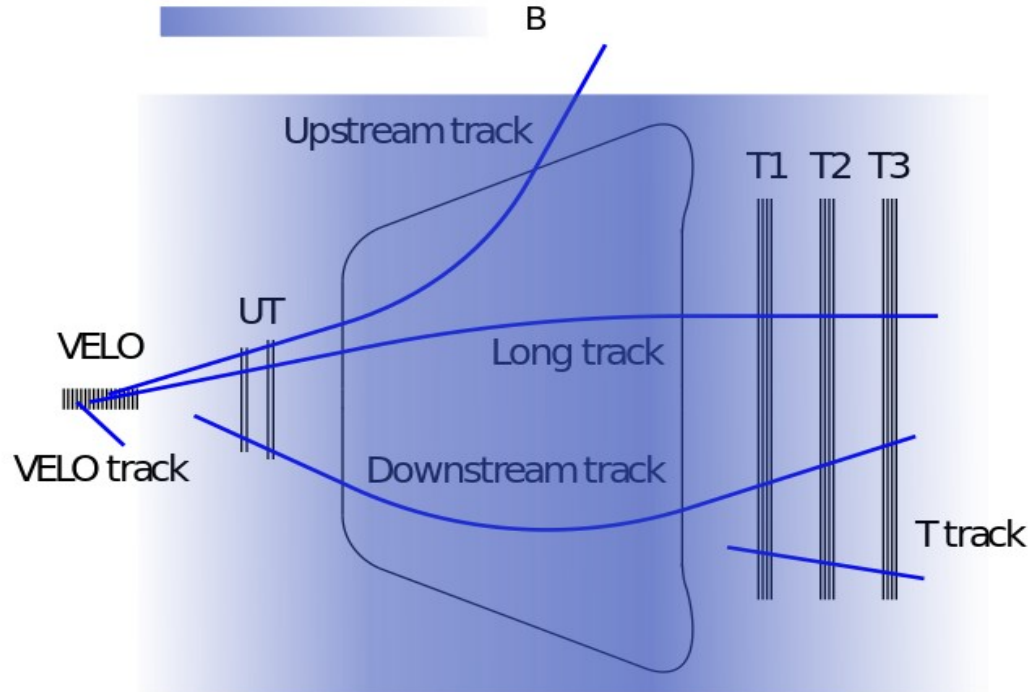


Low level trigger on muon p_T ,
 $B \rightarrow K^* \mu\mu$



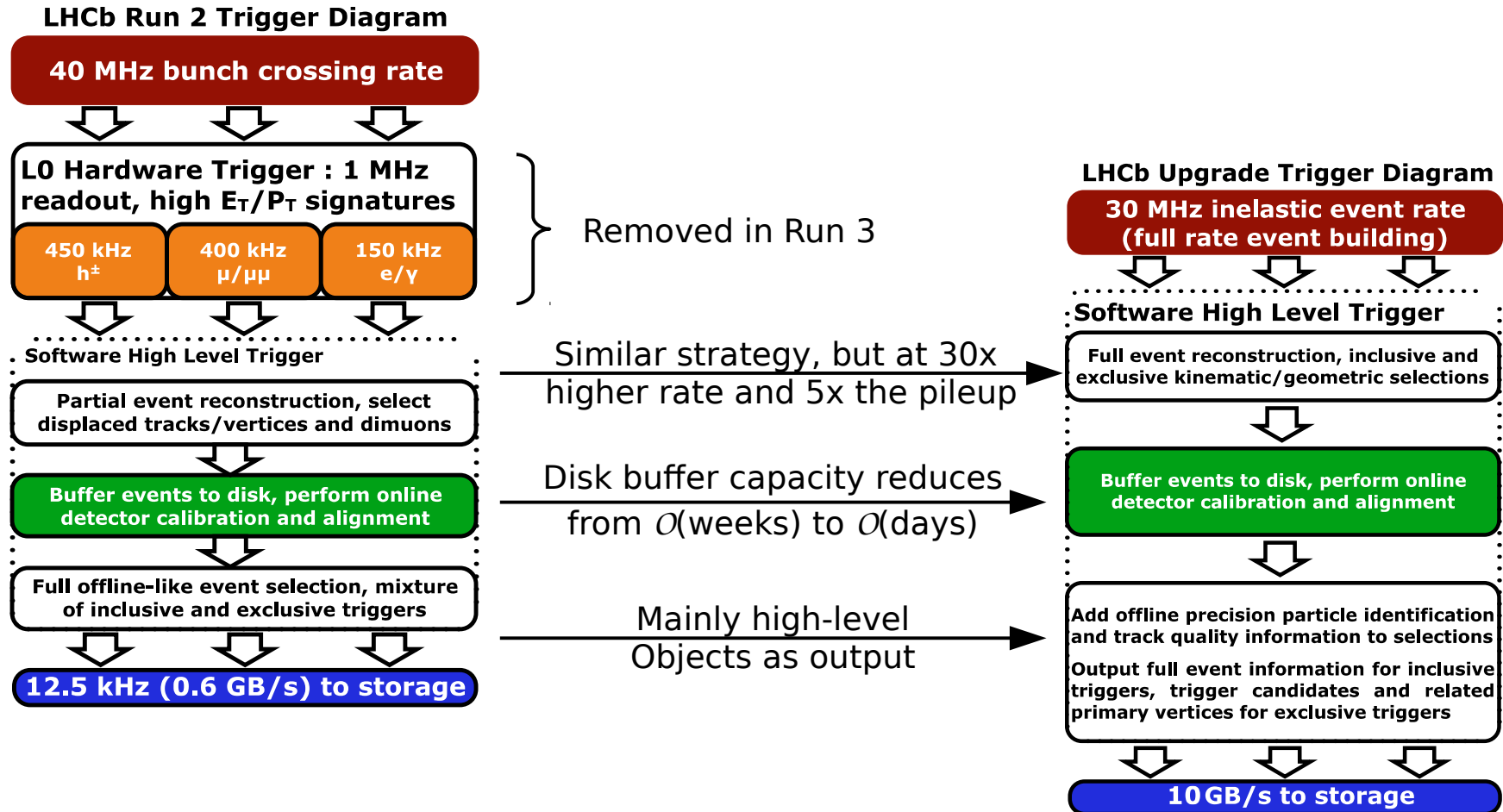
Need track reconstruction at first trigger stage

Tracks in the LHCb detector

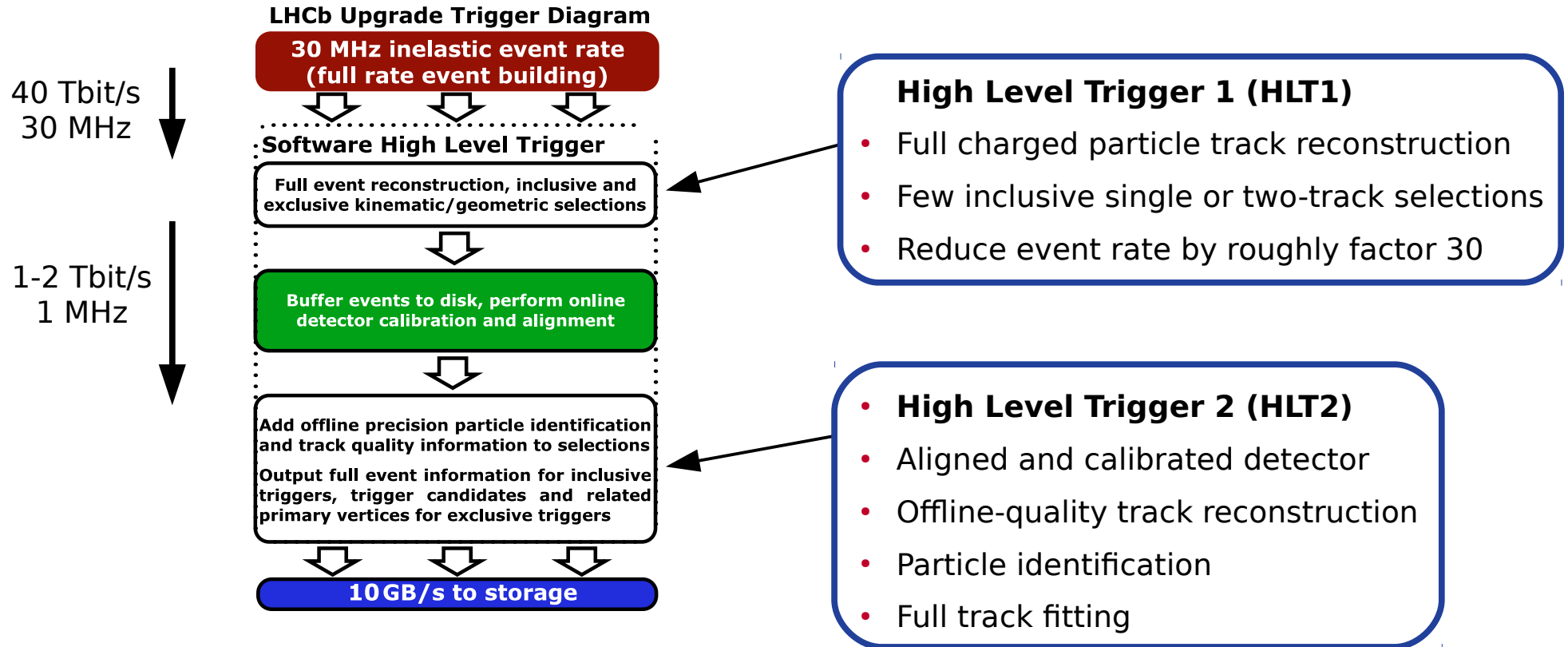


Need information from many subdetectors → read out full detector

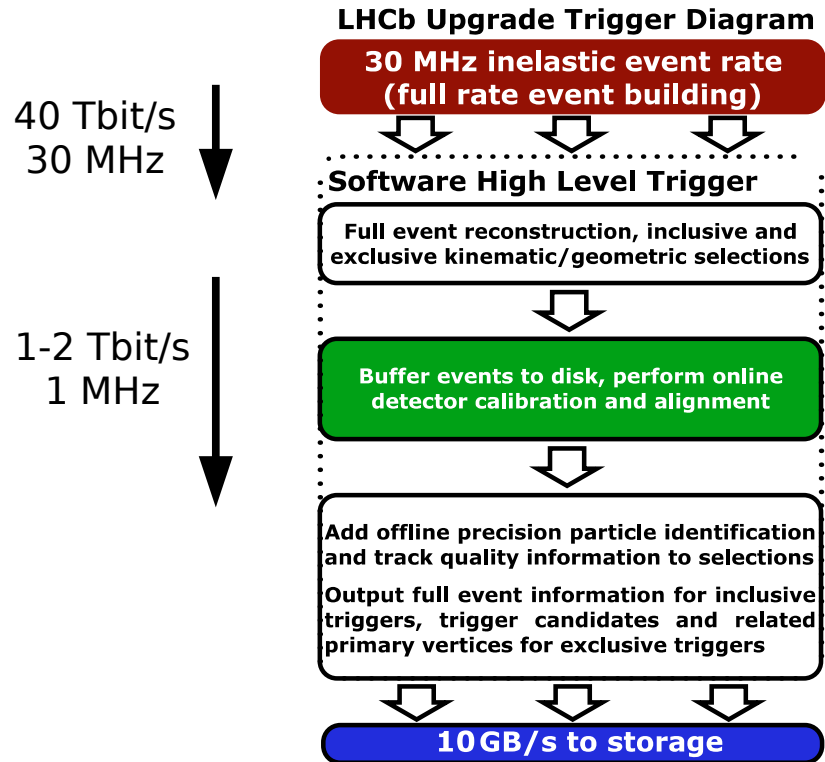
Run 2 versus Run 3 trigger



Trigger in Run 3 (2021)



Trigger in Run 3 (2021)

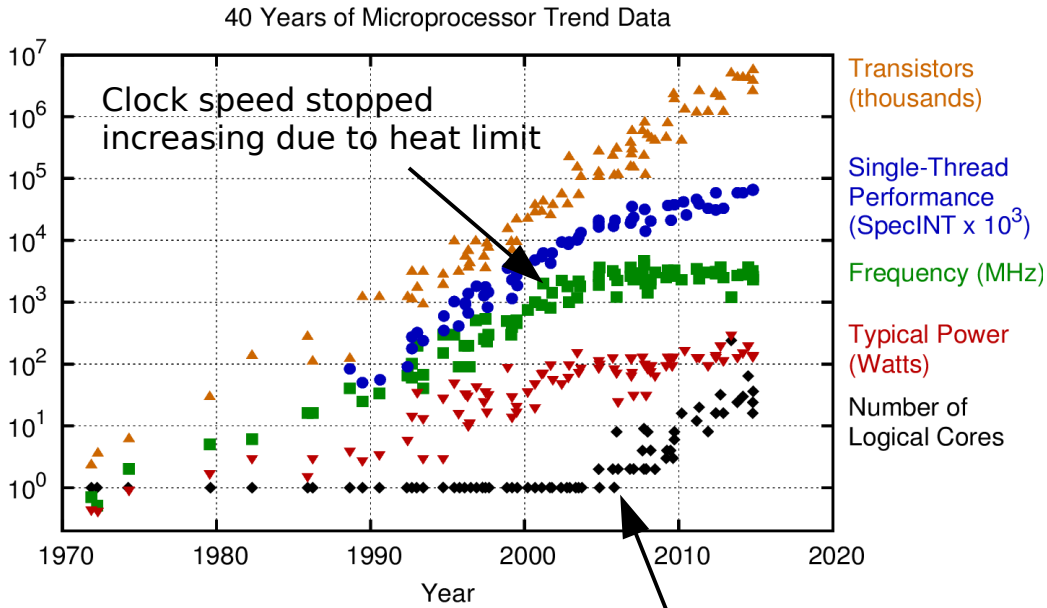


High Level Trigger 1 (HLT1)

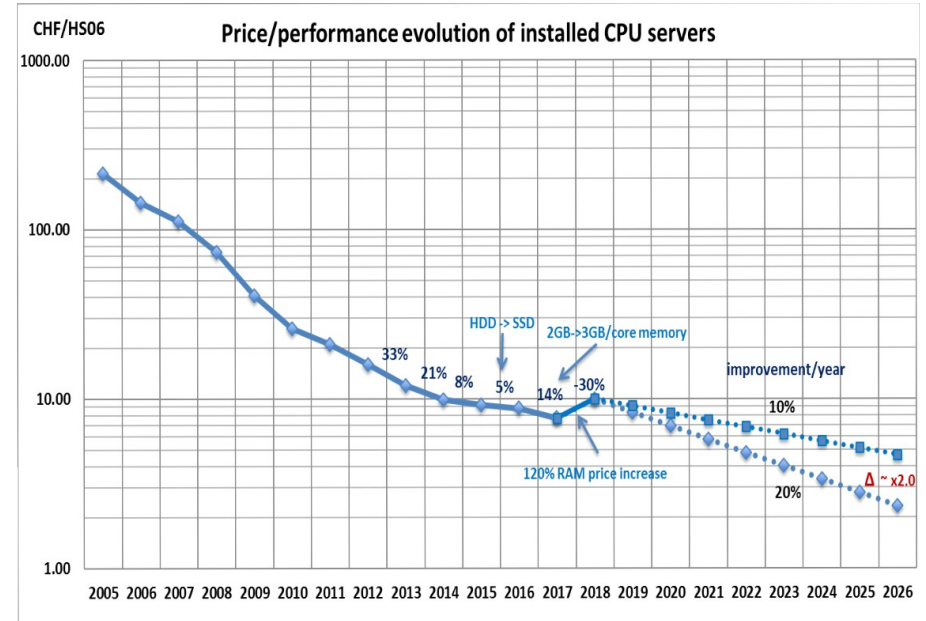
- Full charged particle track reconstruction
- Few inclusive single or two-track selections
- Reduce event rate by roughly factor 30

Track reconstruction @ 30 MHz is a huge computing challenge!

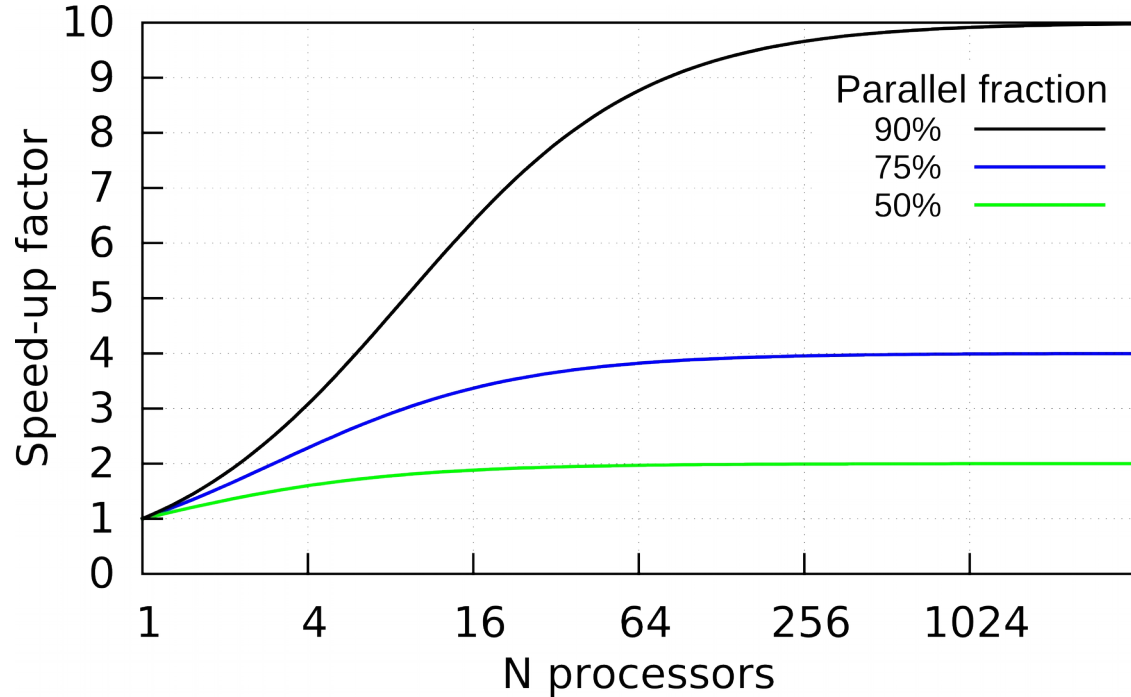
Today's computing landscape



Original data up to the year 2010 collected and plotted by M. Horowitz, F. Labonte, O. Shacham, K. Olukotun, L. Hammond, and C. Batten
New plot and data collected for 2010-2015 by K. Rupp



Amdahl's law



Speedup in latency = $1 / (S + P/N)$

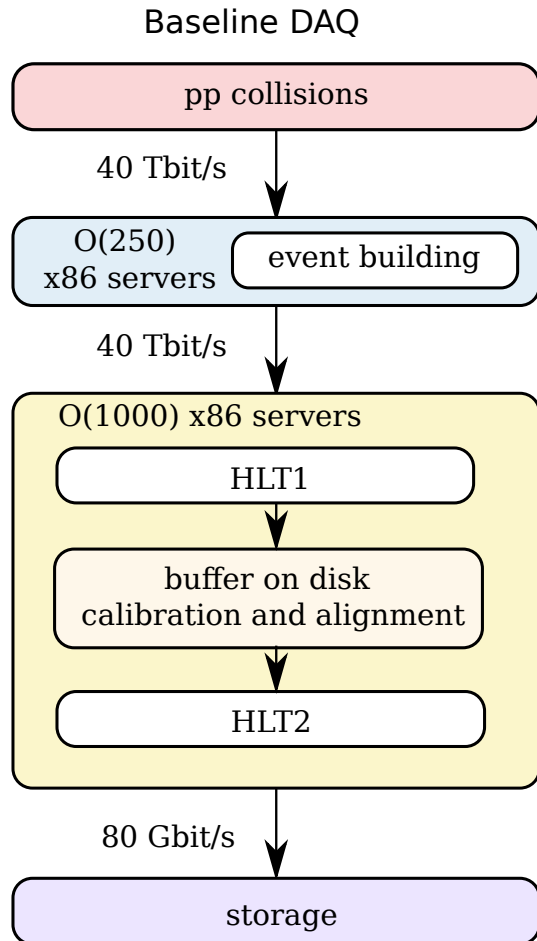
S: sequential part of program

P: parallel part of program

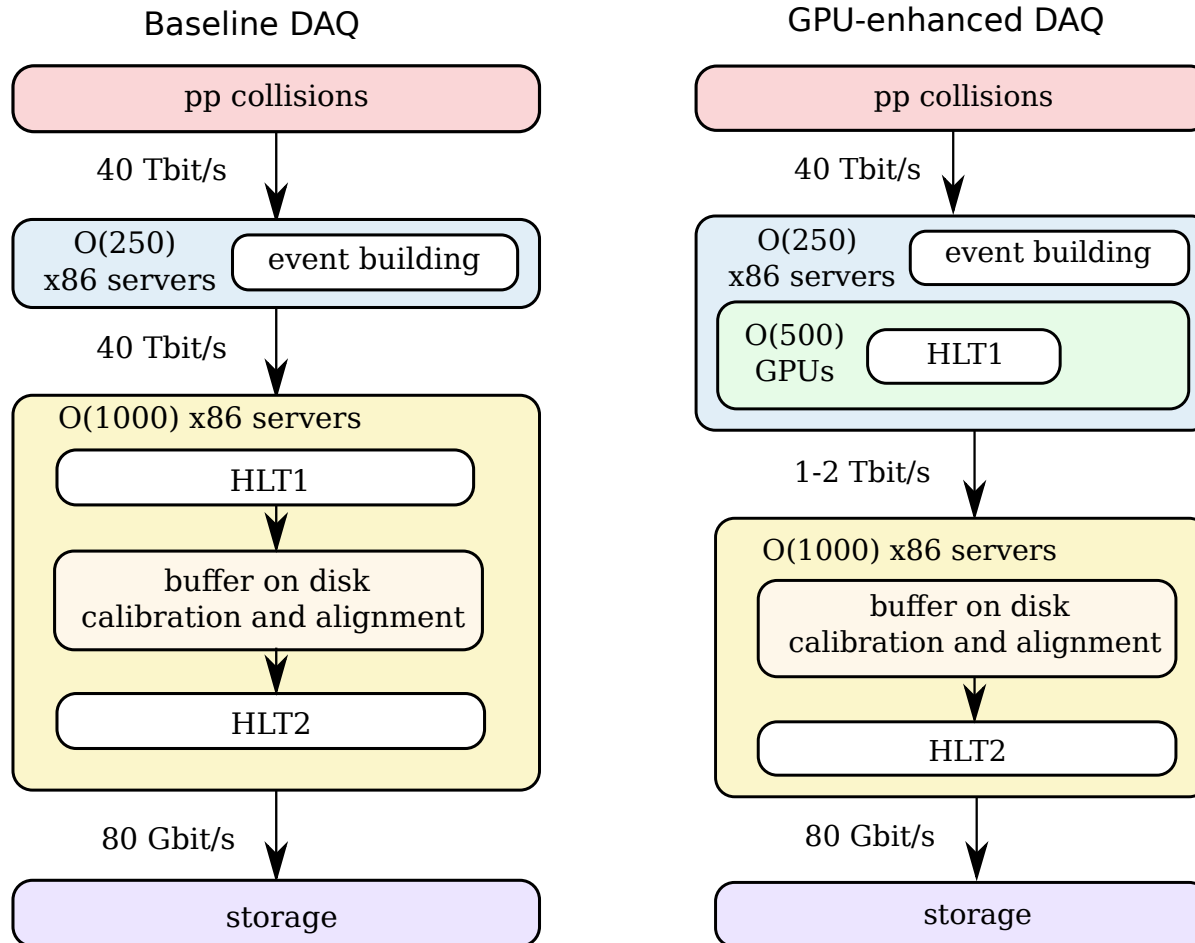
N: number of processors

Can we use the FLOPS available on a GPU to run HLT1 @ 30 MHz?

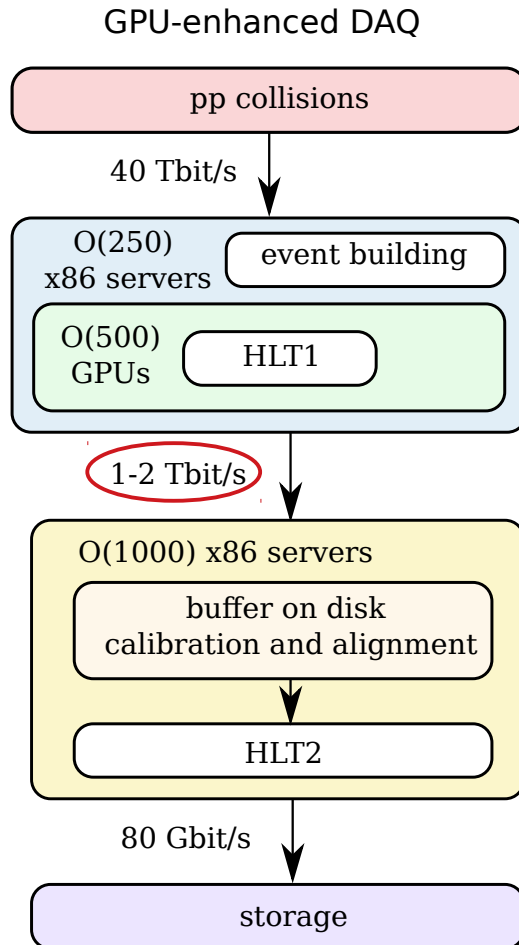
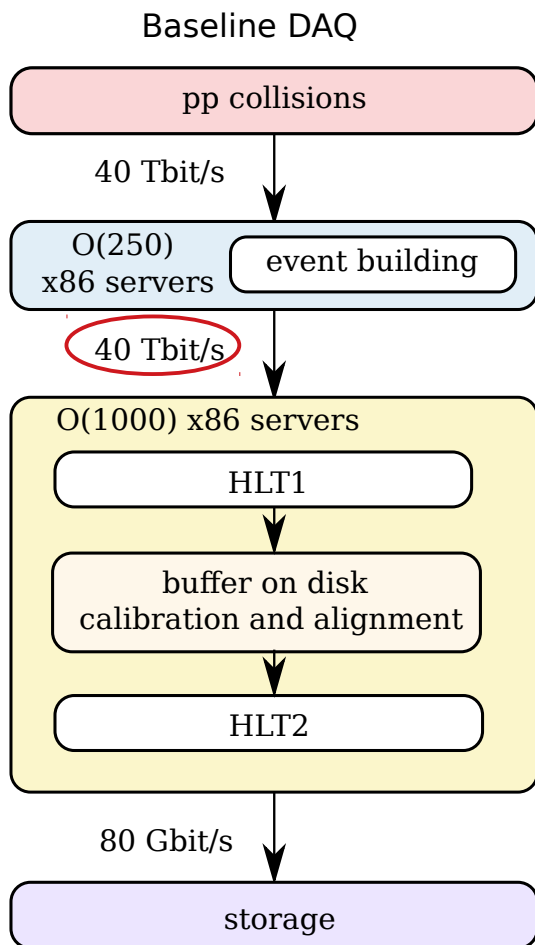
Where to place the GPUs?



Where to place the GPUs?



Where to place the GPUs?



GPUs naturally integrate into LHCb's DAQ

**If HLT1 can run on 500 GPUs
→ Save money on network
→ Buy GPUs instead**

LHCb HLT1 elements

Velo

- Decode raw data
- Clustering of measurements
- Track reconstruction
- Primary vertex reconstruction

UT

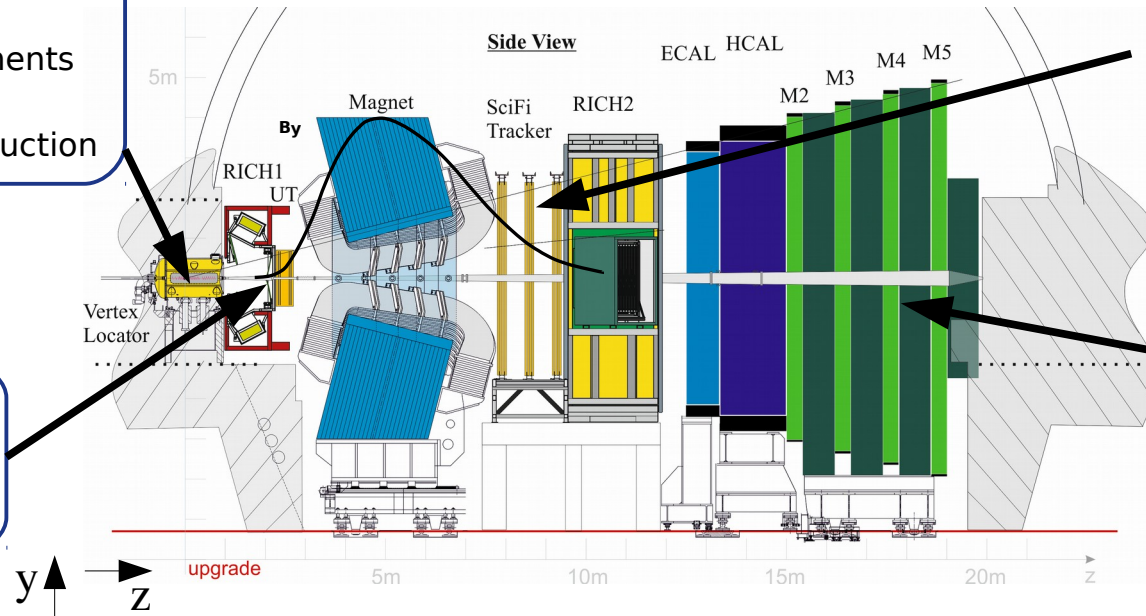
- Decode raw data
- Track reconstruction

SciFi

- Decode raw data
- Track reconstruction

Muons

- Decode raw data
- Match hits to tracks



Track fit: Kalman filter

Find secondary vertices

Selections

- 1-track selection
- 2-track selection
- Based on p , p_t , displacement, vertex criteria and muon identification

How does HLT1 map to GPUs?

| Characteristics of LHCb HLT1 | Characteristics of GPUs |
|---|--|
| Intrinsically parallel problem: <ul style="list-style-type: none">- Run events in parallel- Reconstruct tracks in parallel | Good for <ul style="list-style-type: none">- Data-intensive parallelizable applications- High throughput applications |
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| Huge compute load | Many TFLOPS |
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| Small raw event data (~100 kB) | Connection via PCIe → limited I/O bandwidth |
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| Small event raw data (~100 kB) | Thousands of events fit into O(10) GB of memory |

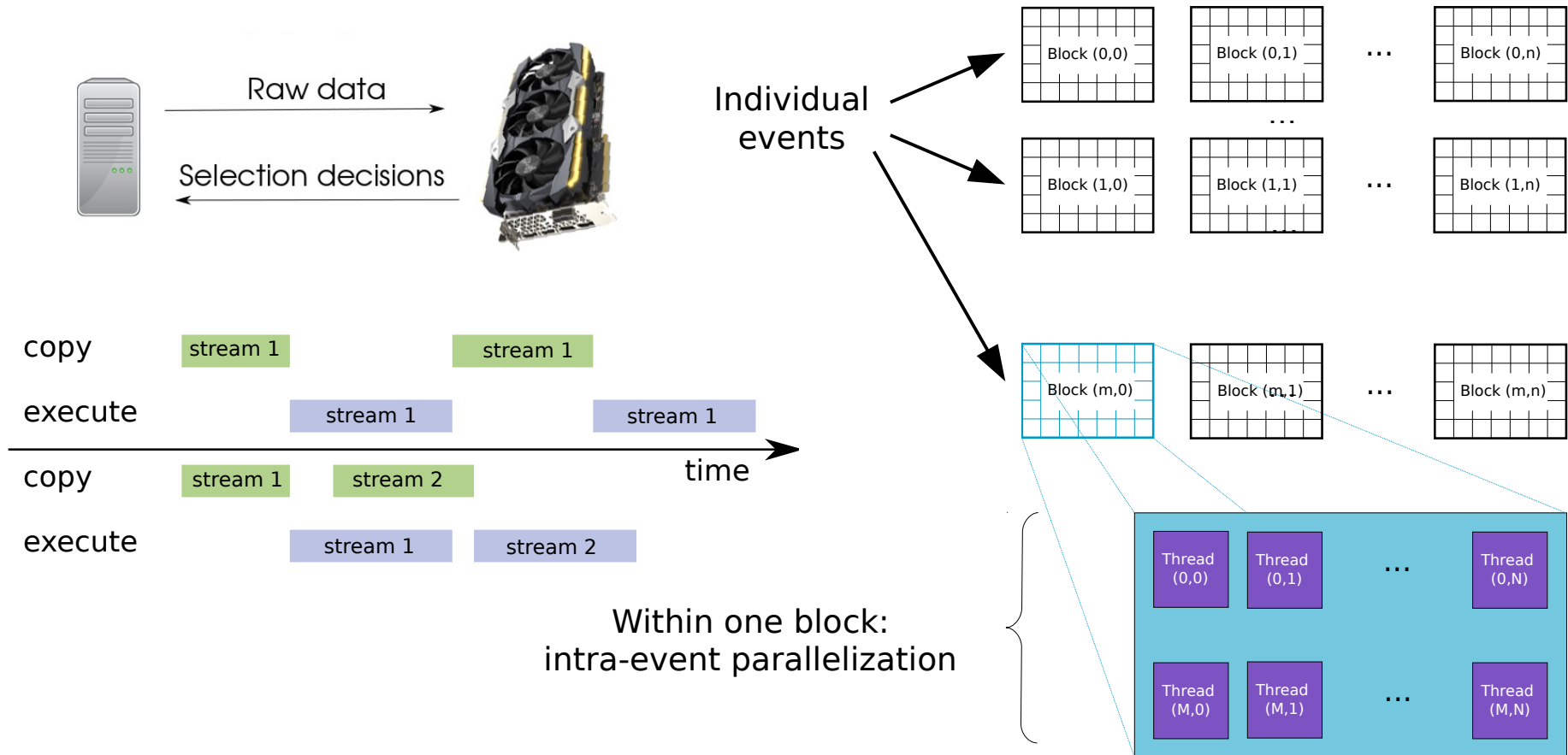
Perfect fit!

The Allen project

- Fully standalone software project: <https://gitlab.cern.ch/lhcb/Allen>
 - Only requirements: a C++17 compliant compiler & CUDA v10.1
 - Built-in physics validation
 - Configurable sequence, custom memory manager
 - Cross-architecture compatibility
-
- Project started in February 2018
 - Roughly 14 part-time developers, mostly students
 - 2 almost full-time
 - After 15 months of development time:
project reviewed as viable solution for Run 3 (starting in 2021)
-
- Named after [Frances E. Allen](#)



HLT1 on GPUs

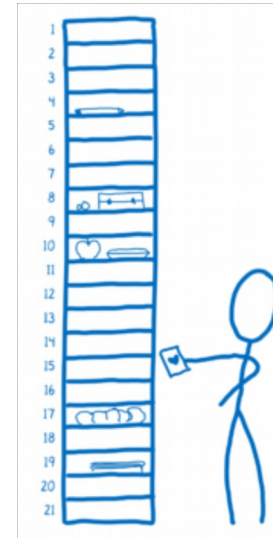


Software framework

Static scheduler
For sequence of algorithms

```
SEQUENCE_T(  
    velo_estimate_input_size_t ,  
    prefix_sum_velo_clusters_t ,  
    velo_masked_clustering_t ,  
    velo_calculate_phi_and_sort_t ,  
    velo_fill_candidates_t ,  
    velo_search_by_triplet_t ,  
    velo_weak_tracks_adder_t)
```

Memory manager for
GPU memory



**Bachelor, Master and PhD students contribute
in only a few months time**

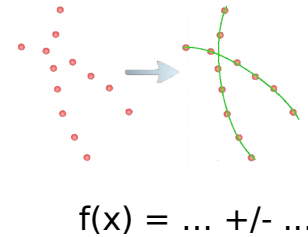
Recurrent tasks of HLT1

Raw data decoding

- Transform binary payload from subdetector raw banks into collections of hits (x,y,z) in LHCb coordinate system
- Parallelizable over events, all subdetectors and readout units

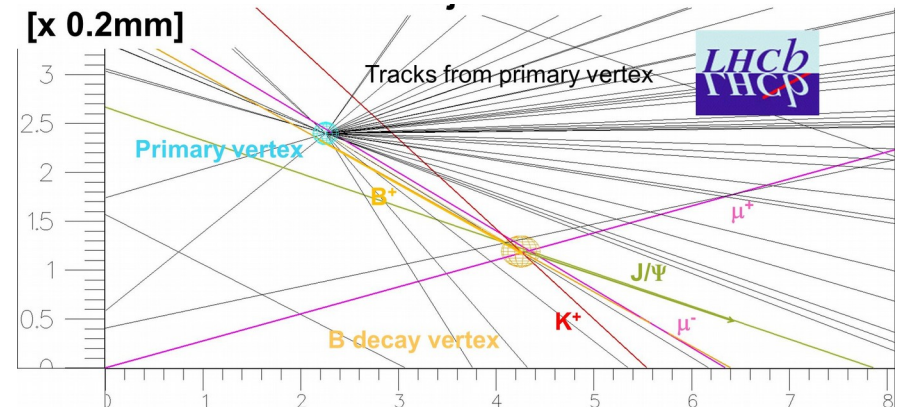
Track reconstruction

- Consists of two steps:
 - Pattern recognition: Which hits belong to which track? → Huge combinatorics
 - Track fitting: Done for every track
- Parallelizable over events, combinations of hits, and tracks



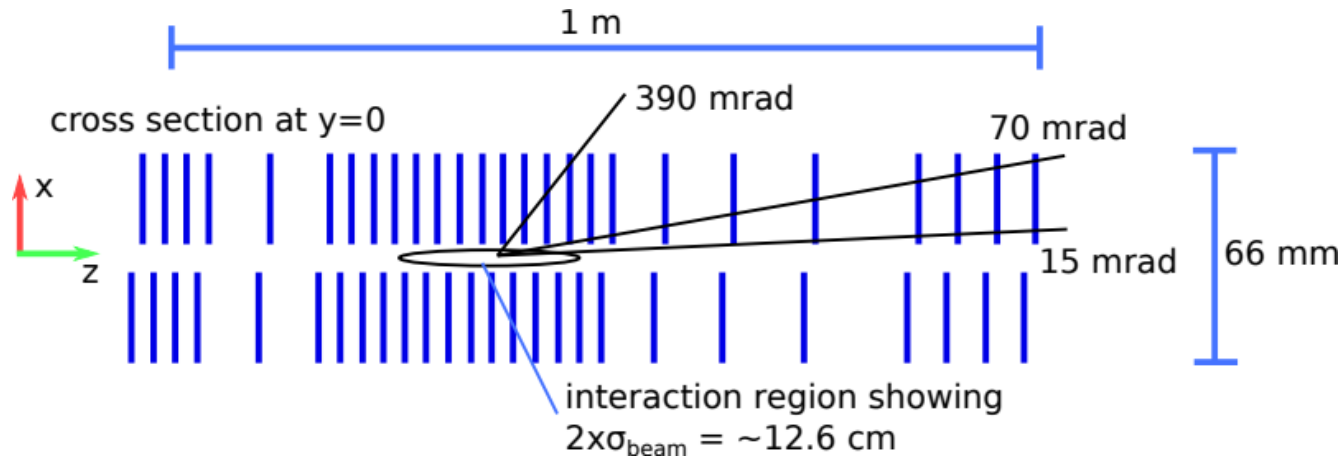
Vertex finding

- Where did proton-proton collisions take place?
- Where did particles decay within the detector volume?
- Parallelizable over events, combinations of tracks

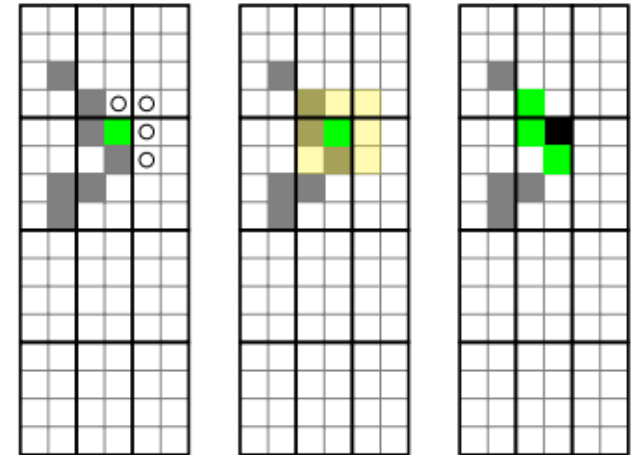


Velo detector: clustering

26 planes of silicon pixel detectors

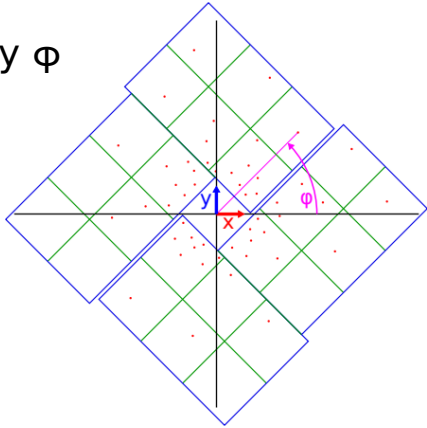


Clustering with bit masks

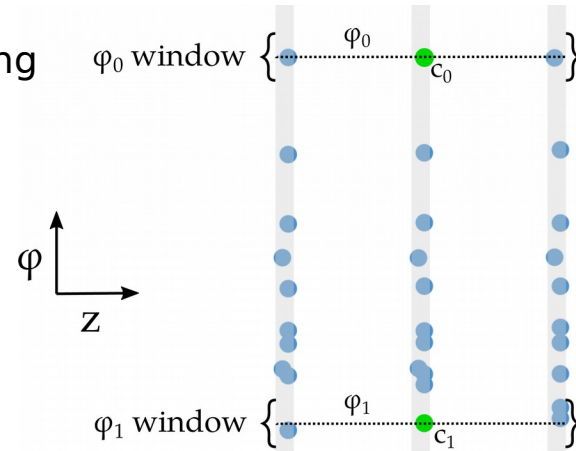


Velo detector: track reconstruction

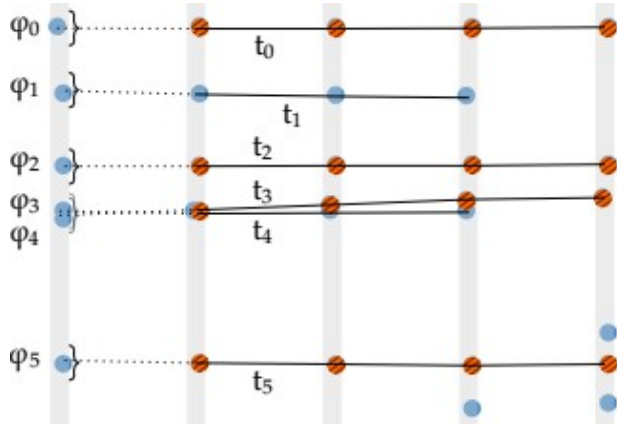
1) Sort hits by ϕ



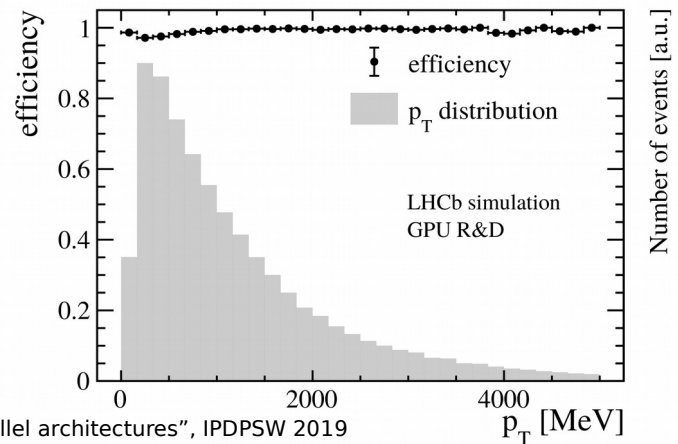
2) Triplet seeding



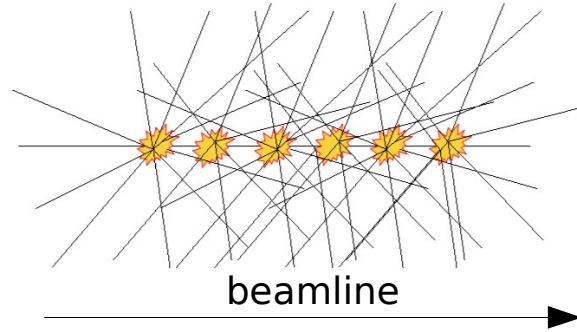
3) Triplet forwarding



Track reconstruction efficiency for tracks originating from B decays

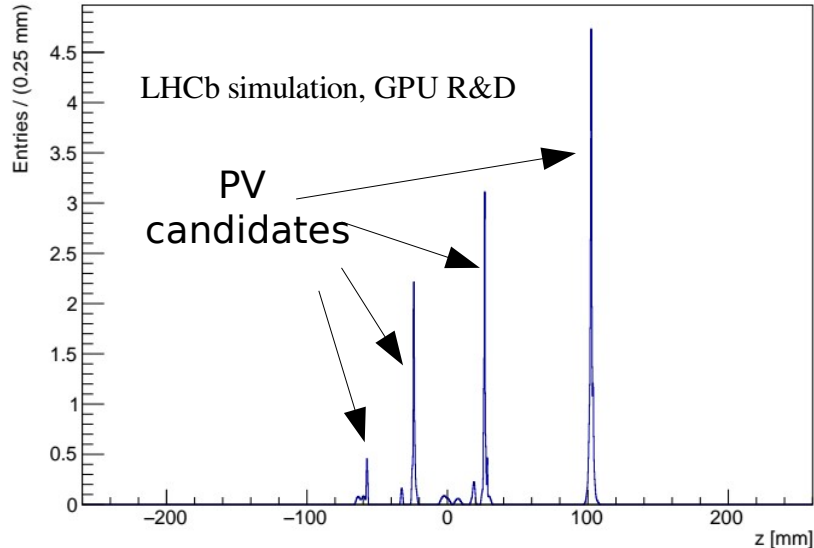


Velo detector: primary vertex reconstruction

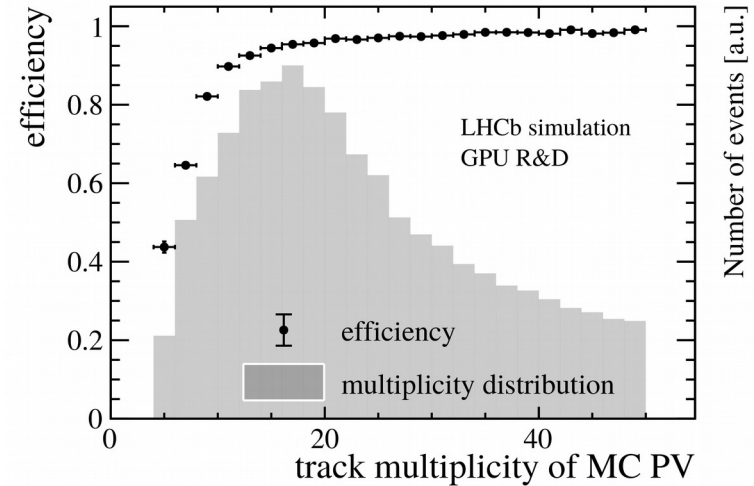


Florian Reiss (LPNHE)

Point of closest approach of tracks to beamline

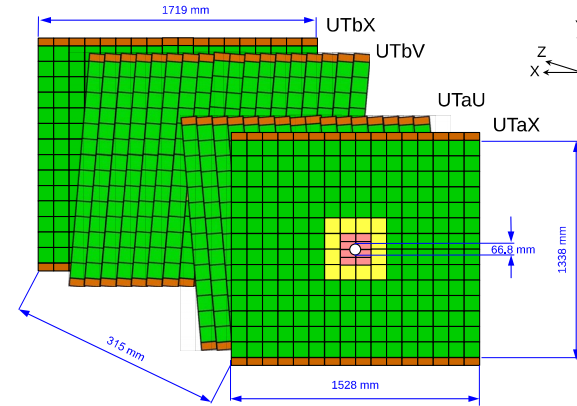
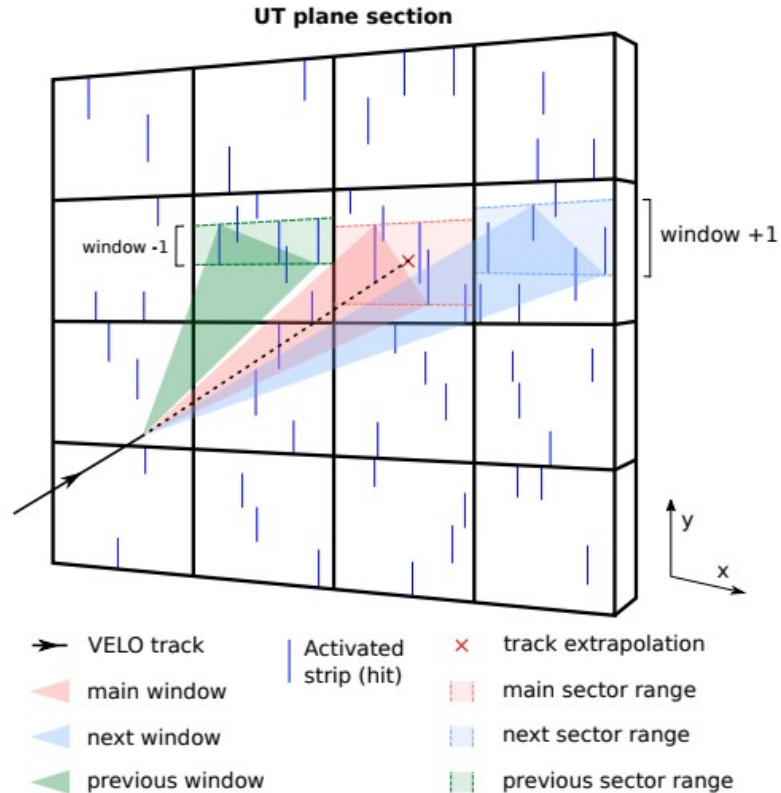


PV reconstruction efficiency

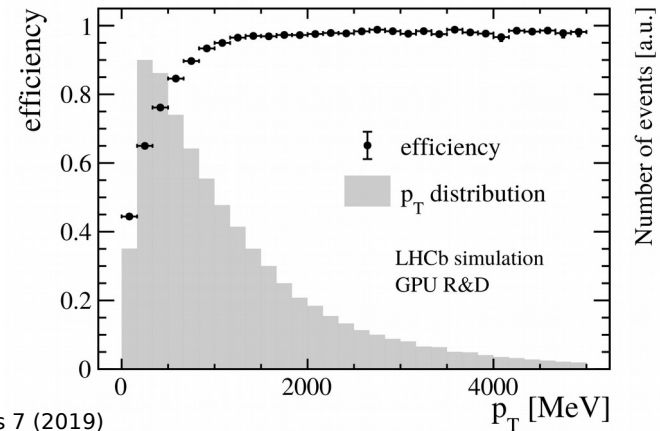


UT detector: track reconstruction

4 planes of silicon strip detectors



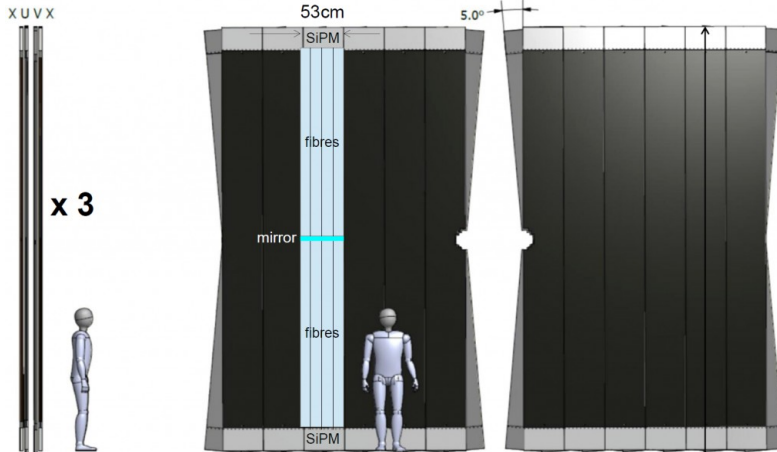
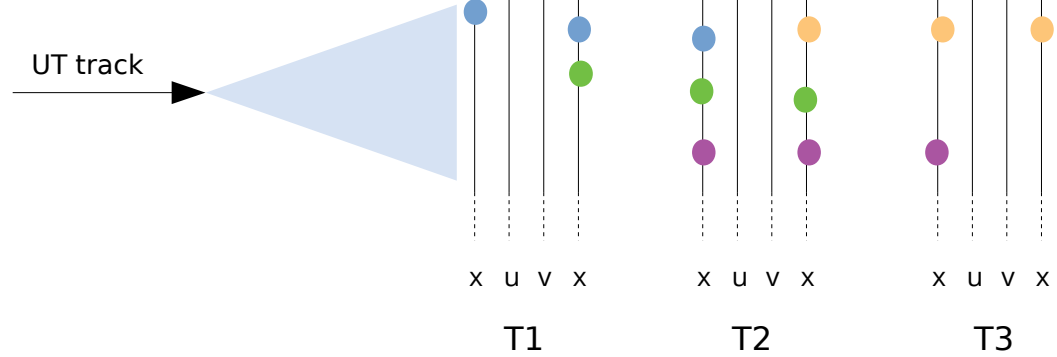
Track reconstruction efficiency for tracks originating from B decays



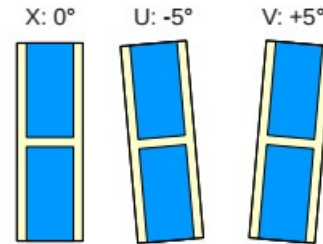
SciFi detector

12 layers of scintillating fibres
Efficiency of fibres $\sim 98-99\%$

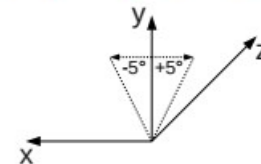
UT track



Stereoangles

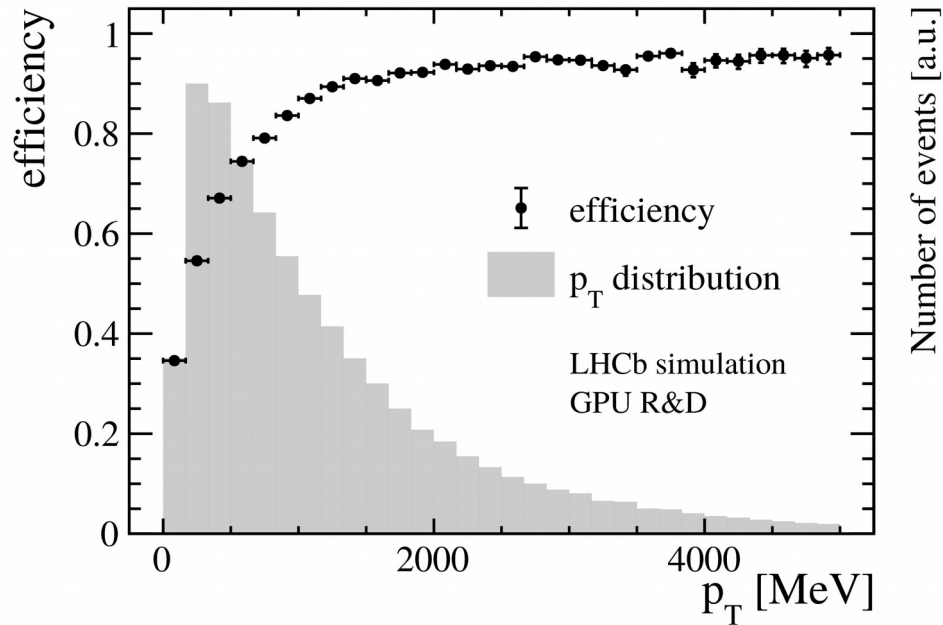


1

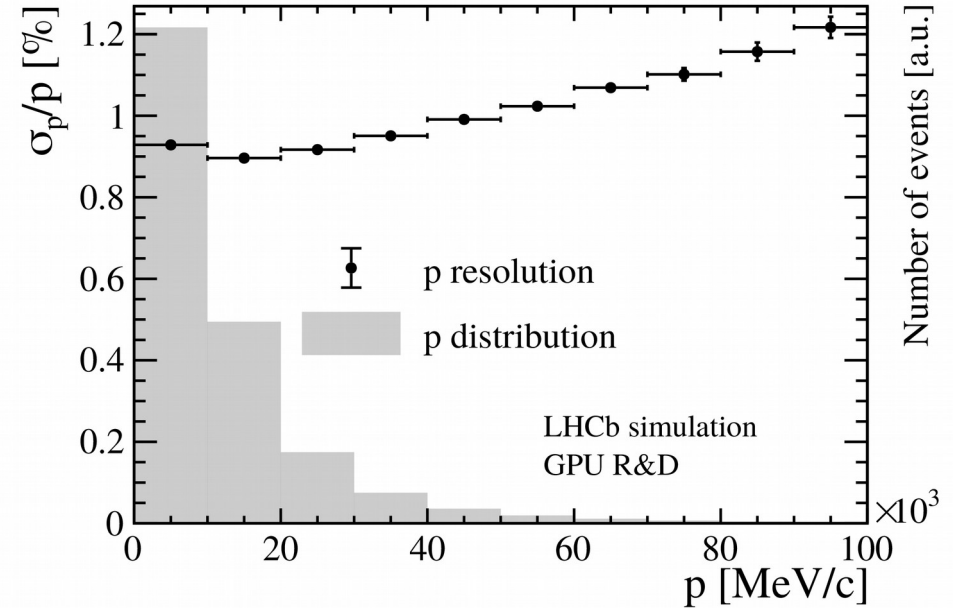


SciFi detector: track reconstruction

Track reconstruction efficiency for tracks originating from B decays

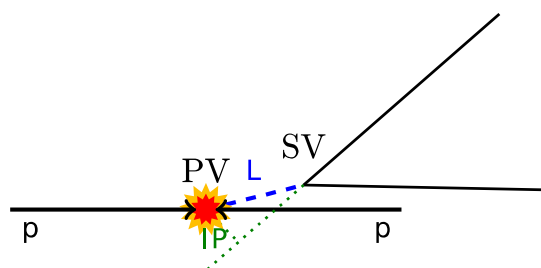
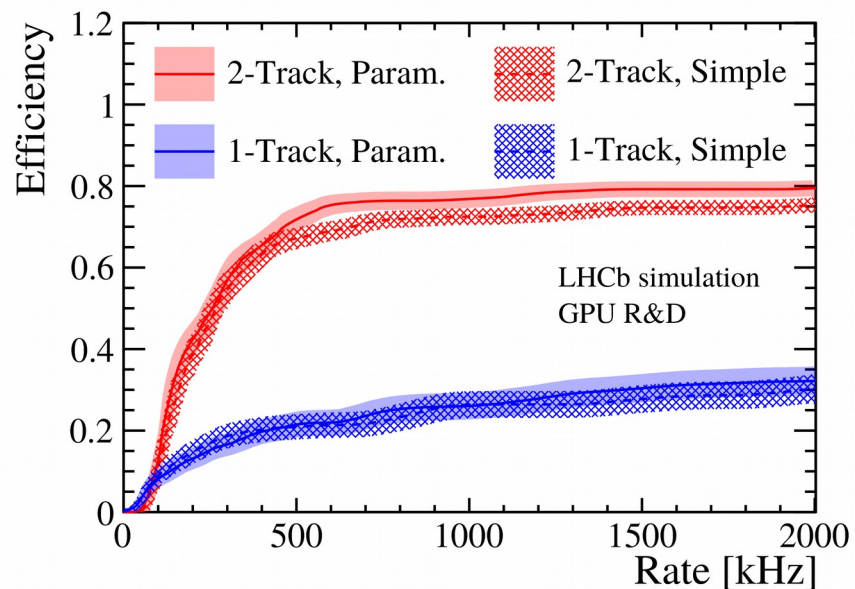


Momentum resolution



Kalman filter

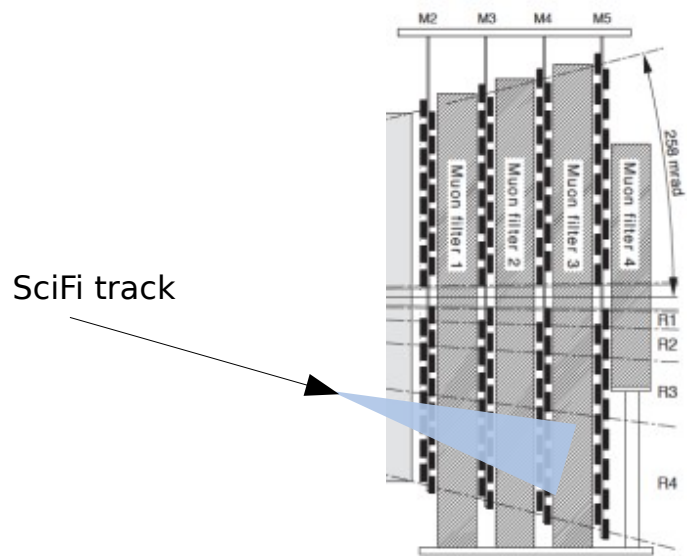
Improved track description → better impact parameter resolution



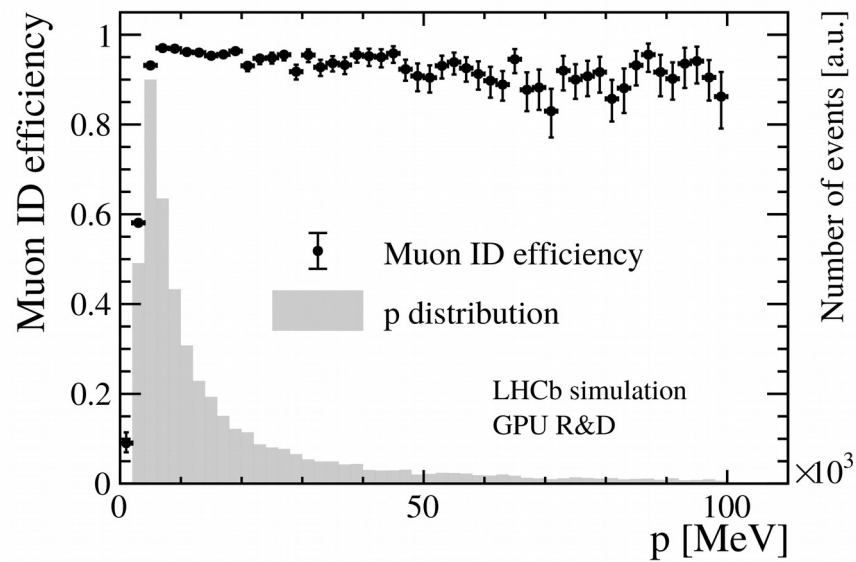
- Simple: Simplified Kalman filter with constant momentum assumption
- Param.: Parameterized Kalman filter with momentum estimate from SciFi track reconstruction

Muon identification

Four multi-wire proportional chambers
Interleaved with iron walls

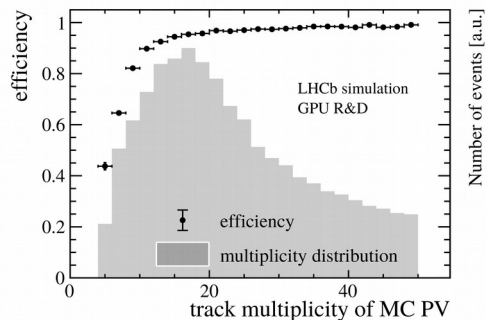


Muon identification efficiency

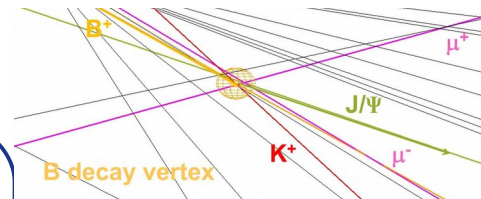


Ingredients for selections

Primary vertices



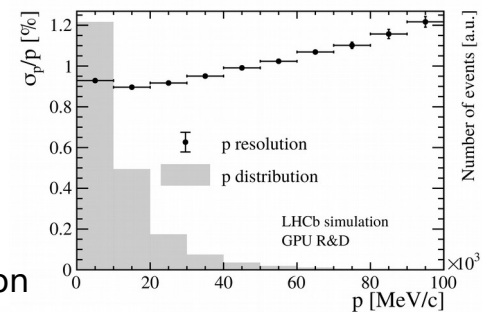
Secondary vertices



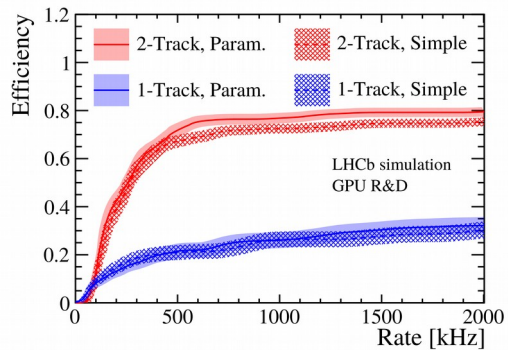
Selections

- 1-track selection
- 2-track selection
- Based on p , p_t , displacement, vertex criteria and muon identification

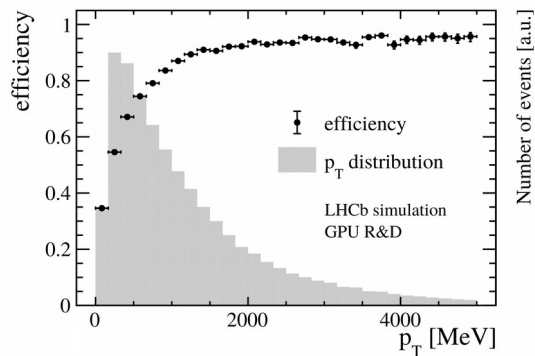
Momentum



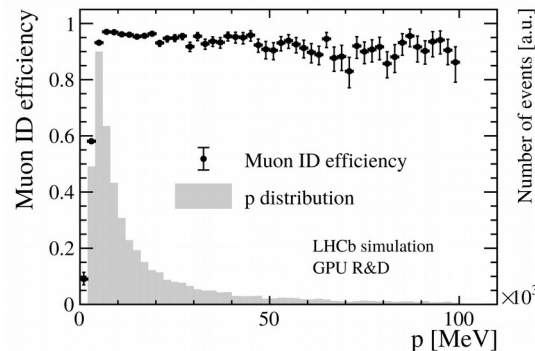
Impact parameter



Tracks



Muon identification



Event selection

| Trigger | Rate [kHz] |
|------------------|--------------|
| 1-Track | 215 ± 18 |
| 2-Track | 659 ± 31 |
| High- p_T muon | 5 ± 3 |
| Displaced dimuon | 74 ± 10 |
| High-mass dimuon | 134 ± 14 |
| Total | 999 ± 38 |

Event rate reduced from 30 MHz to 1 MHz

Selection efficiencies

Allen

Selection efficiencies, values given in %

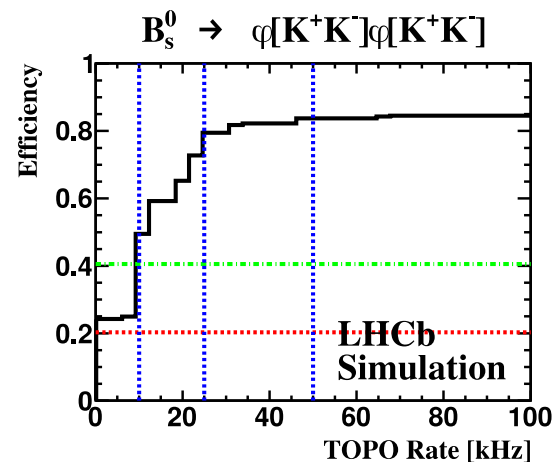
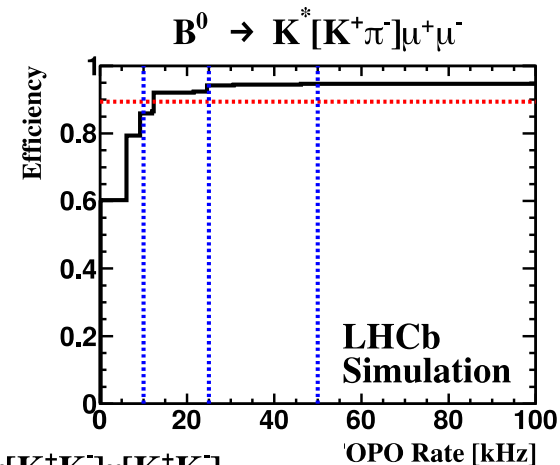
| Signal | GEC | TIS -OR- TOS | TOS | GEC \times TOS |
|--------------------------------------|------------|--------------|------------|------------------|
| $B^0 \rightarrow K^{*0} \mu^+ \mu^-$ | 89 ± 2 | 91 ± 2 | 89 ± 2 | 79 ± 3 |
| $B^0 \rightarrow K^{*0} e^+ e^-$ | 84 ± 3 | 69 ± 4 | 62 ± 4 | 52 ± 4 |
| $B_s^0 \rightarrow \phi\phi$ | 83 ± 3 | 76 ± 3 | 69 ± 3 | 57 ± 3 |
| $D_s^+ \rightarrow K^+ K^- \pi^+$ | 82 ± 4 | 59 ± 5 | 43 ± 5 | 35 ± 4 |
| $Z \rightarrow \mu^+ \mu^-$ | 78 ± 1 | 99 ± 0 | 99 ± 0 | 77 ± 1 |

TIS: Trigger independent from signal

TOS: Trigger on signal

**Consistent physics performance with TDR,
which assumed running on x86 architecture**

Technical Design Report



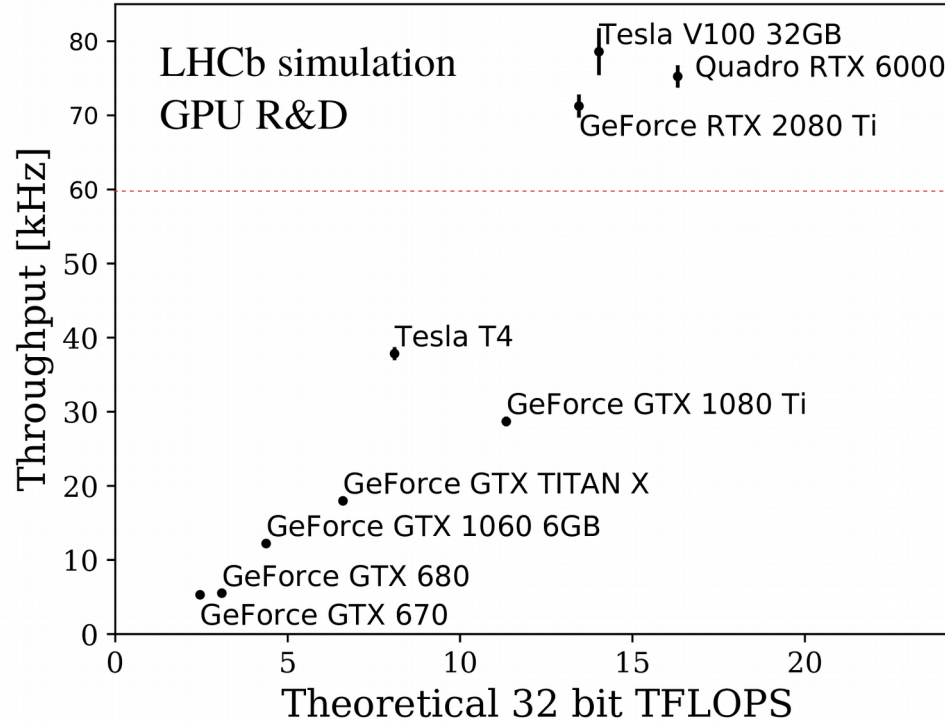
Full HLT1 running on GPUs

Physics performance matches HLT1 requirements

What about the throughput performance?



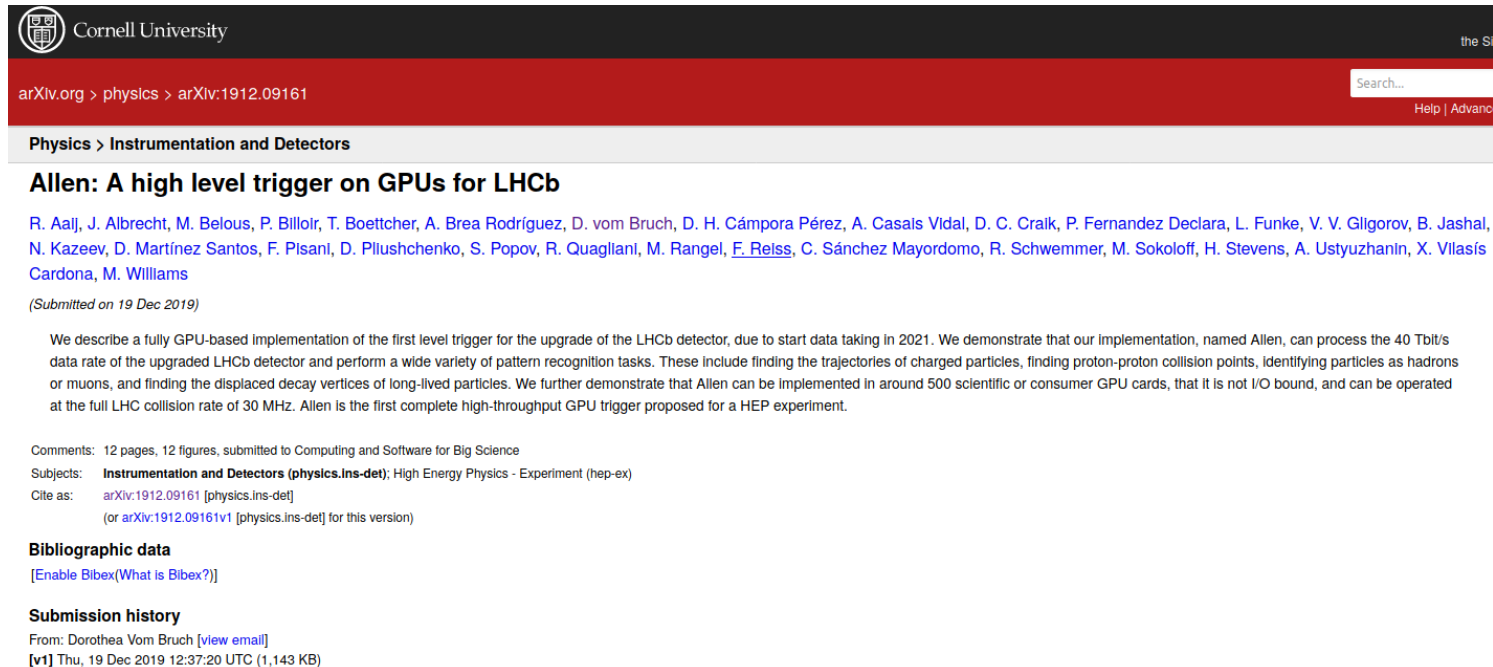
Throughput on various GPUs



The system can run on 500 GPUs
→ network cost saving → no additional cost from using GPUs

Allen publication

- First publication submitted: [arXiv:1912.09161](https://arxiv.org/abs/1912.09161)



The screenshot shows the arXiv.org page for the paper "Allen: A high level trigger on GPUs for LHCb". The page header includes the Cornell University logo and the text "the SLAC". The breadcrumb trail is "arXiv.org > physics > arXiv:1912.09161". The subject category is "Physics > Instrumentation and Detectors". The title is "Allen: A high level trigger on GPUs for LHCb". The authors listed are R. Aal, J. Albrecht, M. Belous, P. Billoir, T. Boettcher, A. Brea Rodríguez, D. vom Bruch, D. H. Cámpora Pérez, A. Casals Vidal, D. C. Craik, P. Fernandez Declara, L. Funke, V. V. Gligorov, B. Jashal, N. Kazeev, D. Martínez Santos, F. Pisani, D. Pliushchenko, S. Popov, R. Quaglioni, M. Rangel, F. Reiss, C. Sánchez Mayordomo, R. Schwemmer, M. Sokoloff, H. Stevens, A. Ustyuzhanin, X. Vilasís Cardona, and M. Williams. The submission date is "Submitted on 19 Dec 2019". The abstract describes a fully GPU-based implementation of the first level trigger for the LHCb detector upgrade, which can process 40 Tbit/s of data and perform various pattern recognition tasks. The paper is 12 pages long with 12 figures and was submitted to "Computing and Software for Big Science". The subjects are "Instrumentation and Detectors (physics.ins-det)" and "High Energy Physics - Experiment (hep-ex)". The citation is "arXiv:1912.09161 [physics.ins-det]" or "arXiv:1912.09161v1 [physics.ins-det] for this version". The bibliographic data section includes a link to "Enable Bibex(What is Bibex?)". The submission history shows it was sent by Dorothea Vom Bruch on Thursday, 19 Dec 2019 at 12:37:20 UTC, with a file size of 1,143 KB.

Cornell University

arXiv.org > physics > arXiv:1912.09161

Search...

Help | Advance

Physics > Instrumentation and Detectors

Allen: A high level trigger on GPUs for LHCb

R. Aal, J. Albrecht, M. Belous, P. Billoir, T. Boettcher, A. Brea Rodríguez, D. vom Bruch, D. H. Cámpora Pérez, A. Casals Vidal, D. C. Craik, P. Fernandez Declara, L. Funke, V. V. Gligorov, B. Jashal, N. Kazeev, D. Martínez Santos, F. Pisani, D. Pliushchenko, S. Popov, R. Quaglioni, M. Rangel, F. Reiss, C. Sánchez Mayordomo, R. Schwemmer, M. Sokoloff, H. Stevens, A. Ustyuzhanin, X. Vilasís Cardona, M. Williams

(Submitted on 19 Dec 2019)

We describe a fully GPU-based implementation of the first level trigger for the upgrade of the LHCb detector, due to start data taking in 2021. We demonstrate that our implementation, named Allen, can process the 40 Tbit/s data rate of the upgraded LHCb detector and perform a wide variety of pattern recognition tasks. These include finding the trajectories of charged particles, finding proton-proton collision points, identifying particles as hadrons or muons, and finding the displaced decay vertices of long-lived particles. We further demonstrate that Allen can be implemented in around 500 scientific or consumer GPU cards, that it is not I/O bound, and can be operated at the full LHC collision rate of 30 MHz. Allen is the first complete high-throughput GPU trigger proposed for a HEP experiment.

Comments: 12 pages, 12 figures, submitted to Computing and Software for Big Science

Subjects: **Instrumentation and Detectors (physics.ins-det)**; High Energy Physics - Experiment (hep-ex)

Cite as: [arXiv:1912.09161](https://arxiv.org/abs/1912.09161) [physics.ins-det]
(or [arXiv:1912.09161v1](https://arxiv.org/abs/1912.09161v1) [physics.ins-det] for this version)

Bibliographic data

[\[Enable Bibex\(What is Bibex?\)\]](#)

Submission history

From: Dorothea Vom Bruch [\[view email\]](#)
[v1] Thu, 19 Dec 2019 12:37:20 UTC (1,143 KB)

Integration test with event building server

Impact on event building when running Allen?



Monitoring temperatures, memory bandwidths, processing rate, ...



The Allen team



NATIONAL RESEARCH UNIVERSITY

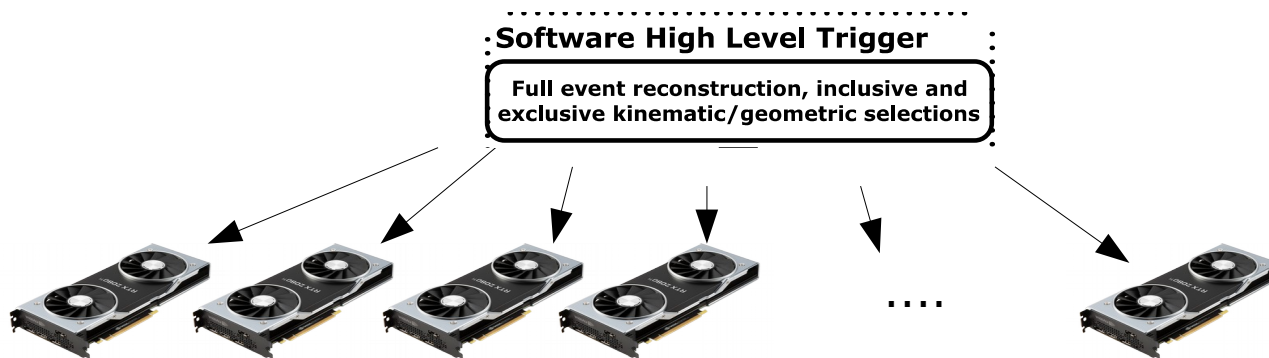
laSalle

UNIVERSITAT RAMON LLULL

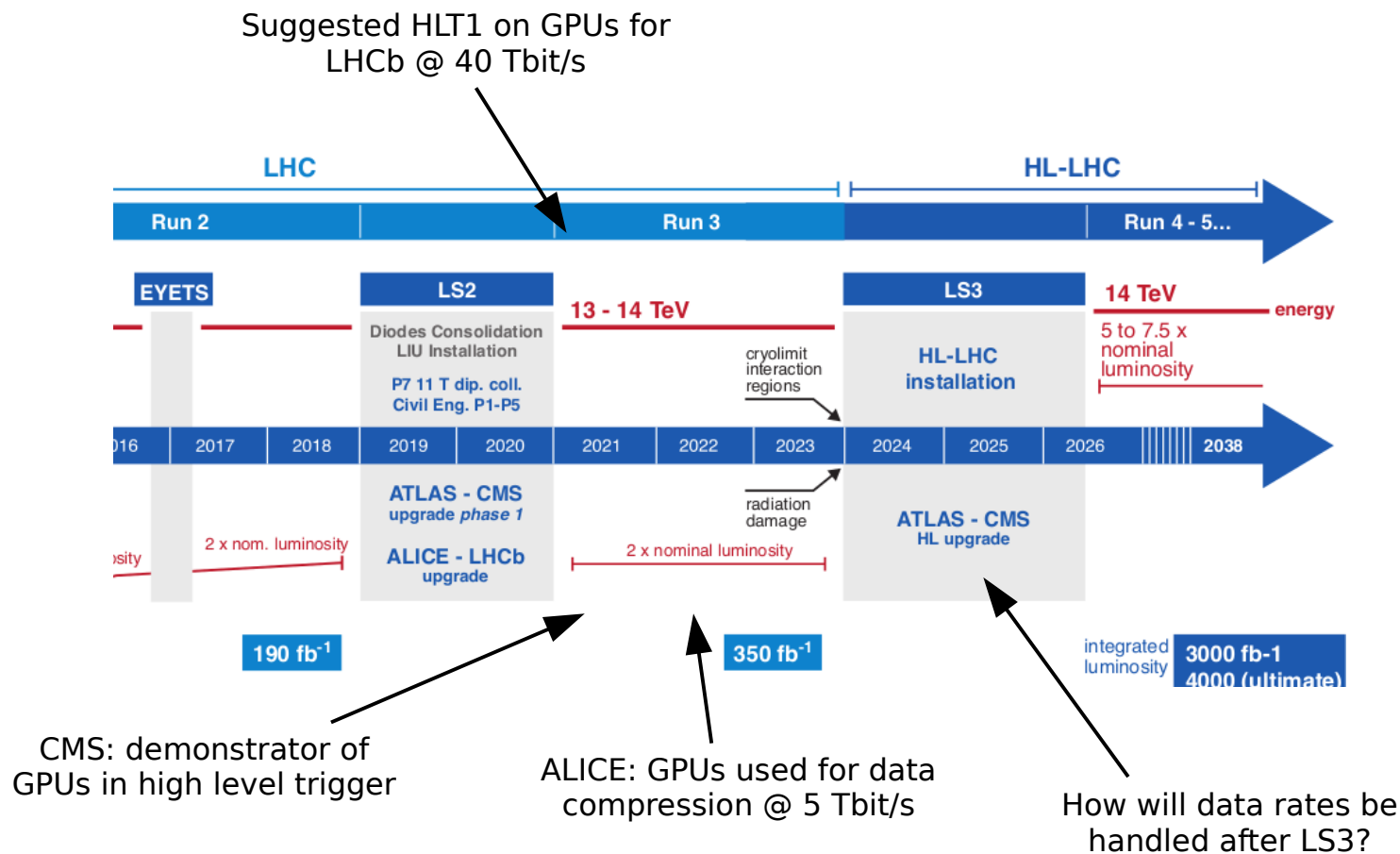


Summary

- Allen is the first complete high throughput trigger implementation on GPUs
- Baseline HLT1 can run on GPUs
- Efficient selections enable full exploitation of statistics in Run 3
→ crucial to explore new physics scenarios
- Scaling of GPU performance → maximize physics discovery potential of LHCb



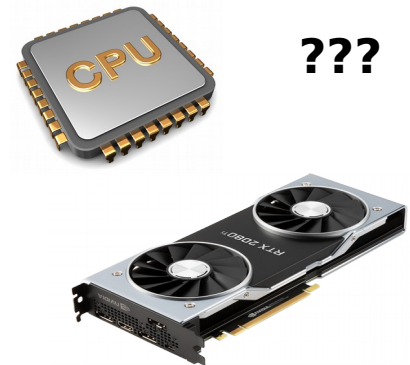
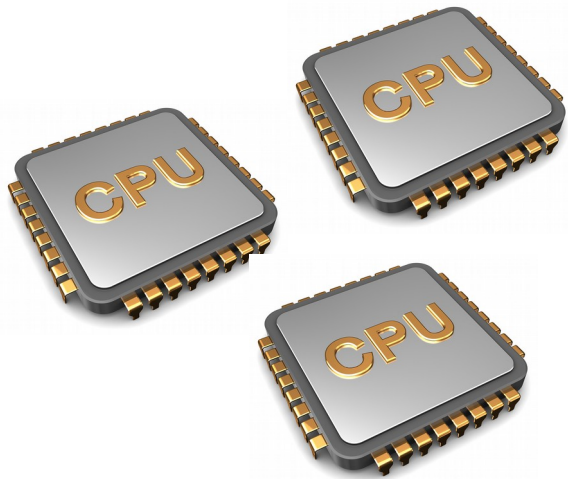
LHC Schedule



Outlook

- Features of Allen are not tied to HLT1 for LHCb
- High-throughput applications can profit from a similar setup
- Ideas for parallelization of algorithms can be useful for other applications

- Higher luminosity not only challenges real-time event selection
- Simulation production also requires major computing resources
- Need common effort to make best use of heterogeneous computing within high energy physics



Backup

Graphics requirements

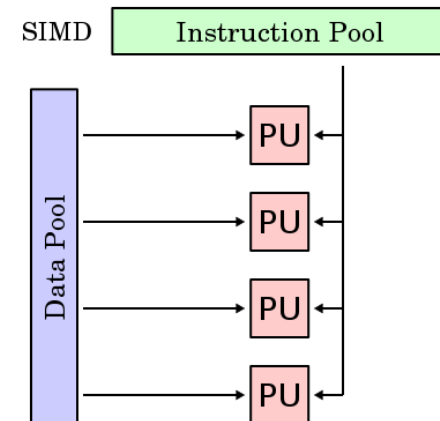
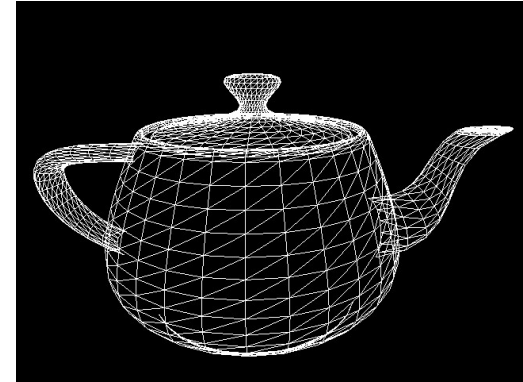
Graphics pipeline

- Huge amount of arithmetic on independent data:
 - Transforming positions
 - Generating pixel colors
 - Applying material properties and light situation to every pixel

Hardware needs

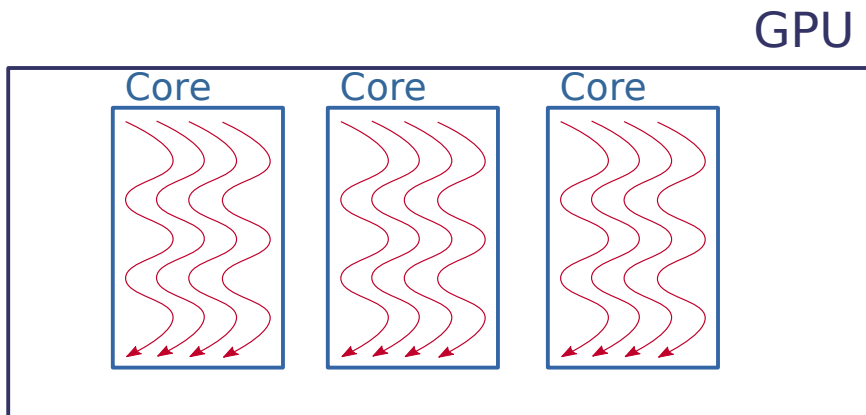
- Access memory simultaneously and contiguously
- Bandwidth more important than latency
- Floating point and fixed-function logic

→ **Single instruction** applied to **multiple data**: SIMT

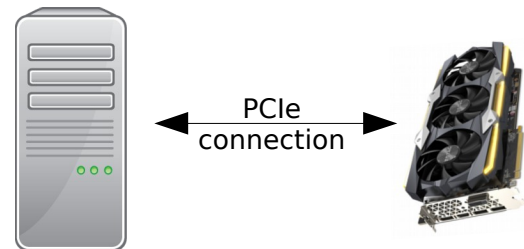


GPU in a nutshell

- Core: multiple SIMT threads grouped together
- GPU: many cores grouped together



Data transfer to a GPU



| PCIe generation | 16 lanes | Year |
|-----------------|------------|------|
| 3.0 | 15.75 GB/s | 2010 |
| 4.0 | 31.5 GB/s | 2017 |

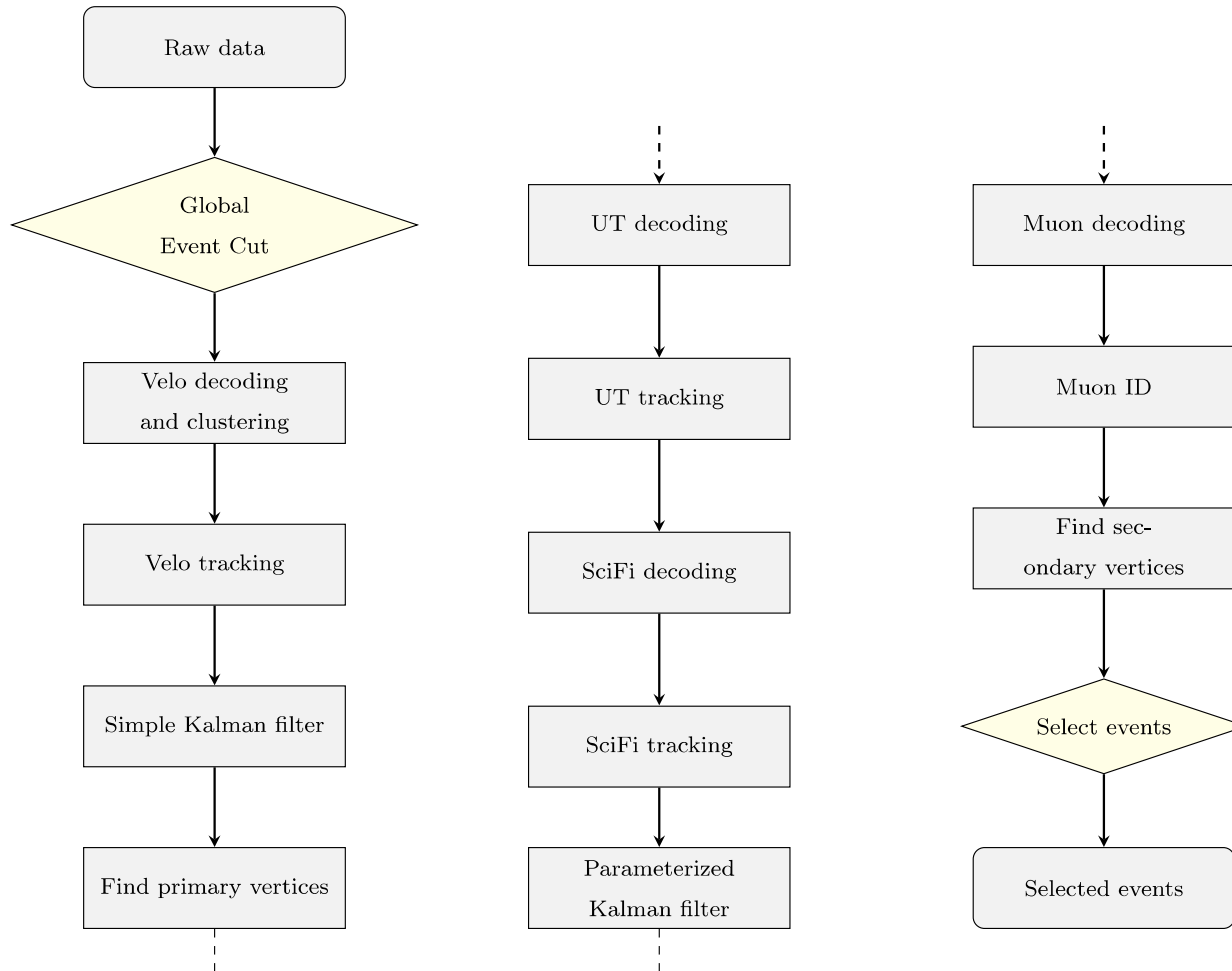
Selections

| Selection name | Criteria |
|-------------------|---|
| 1-Track | Single displaced track with high p_T |
| 2-Track | Two-track vertex with significant displacement and p_T |
| High- p_T muon | Single muon with high p_T |
| Displaced diumuon | Displaced di-muon vertex |
| High-mass dimuon | Di-muon vertex with mass near or larger than the J/Ψ |

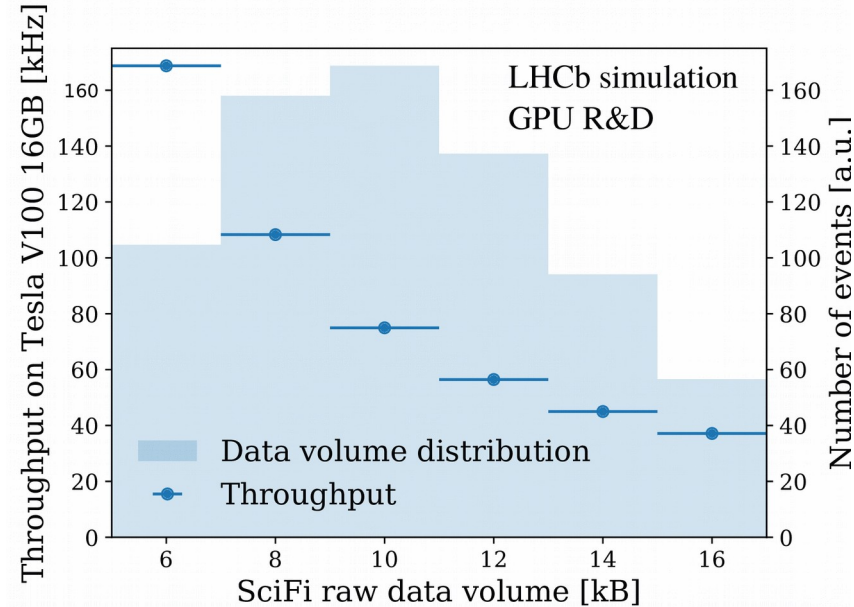
Criteria applied to signal decays in efficiency calculations

| | |
|-----------------------------|--|
| b and c hadrons | $p_T > 2$ GeV $\tau > 0.2$ ps |
| b and c hadron children | $p_T > 200$ MeV $2 < \eta < 5$ reconstructible in the Velo and SciFi detector (long track) |
| Z children | $p_T > 20$ GeV $2 < \eta < 5$ reconstructible in the Velo and SciFi detector (long track) |

HLT1 algorithms in Allen



Throughput versus occupancy



- Data volume proportional to occupancy
- Low performance decrease at high occupancy
→ will be able to handle real data (likely higher in occupancy than simulation)

GPUs for throughput measurement

CUDA streams

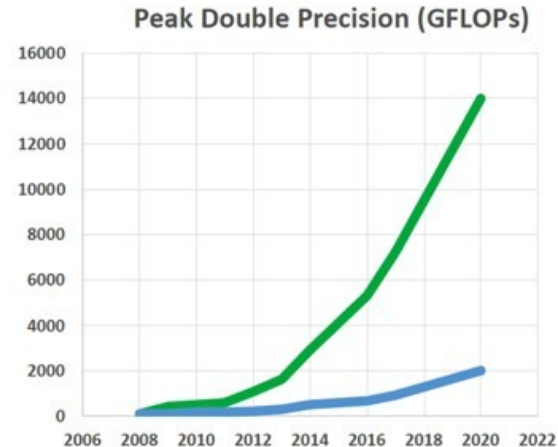
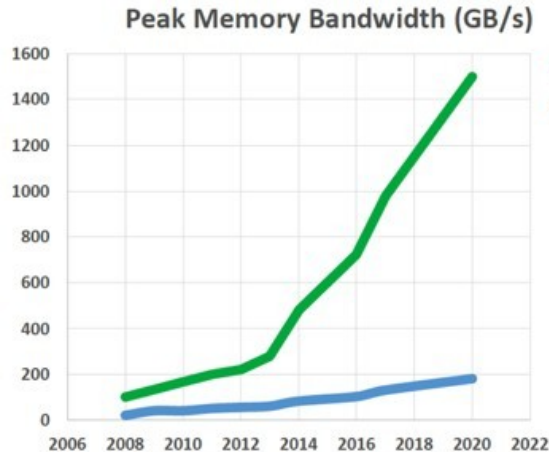


| Allen settings | Threads (-t) | Memory (-m) | Number of events (-n) | Repetitions (-r) |
|----------------|-----------------|----------------|--------------------------|---------------------|
| High | 12 | 700 | 1000 | 100 |
| Low | 2 | 700 | 1000 | 100 |

| Card | # cores | Max freq. (GHz) | Cache (MiB, L2) | DRAM (GiB) | DRAM type | CUDA cap. | Allen settings |
|---------------------|---------|--------------------|--------------------|---------------|--------------|--------------|-------------------|
| Geforce GTX 670 | 1344 | 1.06 | 0.5 | 1.95 | GDDR5 | 3.0 | Low |
| Geforce GTX 680 | 1536 | 1.14 | 0.5 | 1.95 | GDDR5 | 3.0 | Low |
| Geforce GTX 780 Ti | 2880 | 0.93 | 1.5 | 2.95 | GDDR5 | 3.5 | Low |
| Geforce GTX 980 | 2048 | 1.29 | 2 | 2.01 | GDDR5 | 5.2 | Low |
| Geforce GTX TITAN X | 3072 | 1.08 | 3 | 11.92 | GDDR5 | 5.2 | High |
| Geforce GTX 1060 6G | 1280 | 1.81 | 1.5 | 5.94 | GDDR5 | 6.1 | Low |
| Geforce GTX 1080 Ti | 3584 | 1.67 | 2.75 | 10.92 | GDDR5 | 6.1 | High |
| Geforce RTX 2080 Ti | 4352 | 1.545 | 6 | 10.92 | GDDR5 | 7.5 | High |
| Tesla T4 | 2560 | 1.59 | 4 | 15.72 | GDDR6 | 7.5 | High |
| Tesla V100 32GB | 5120 | 1.37 | 6 | 32 | HBM2 | 7.0 | High |

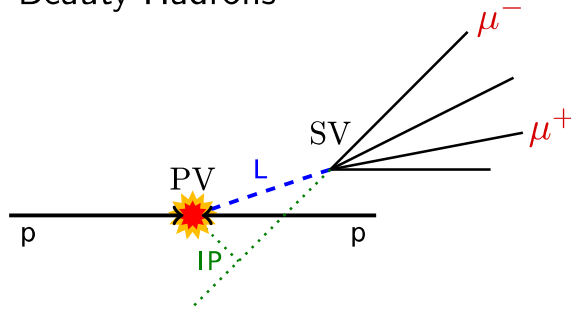
Computing costs and prospects

| Architecture | GPU | CPU |
|-----------------------|------------------------|------------------------------------|
| Performance | > 60 kHz | 35 kHz on 20 cores |
| Amount | 500 | 1500 (12C / 24T each) |
| Type | RTX 2080 Ti GPUs | Intel Xeon Silver 4116 2.1 G + RAM |
| Price | 0.5M \$ | 2M \$ |
| Compactness (servers) | 250 (< 100 with PCIe4) | 750 (dual-socket) |

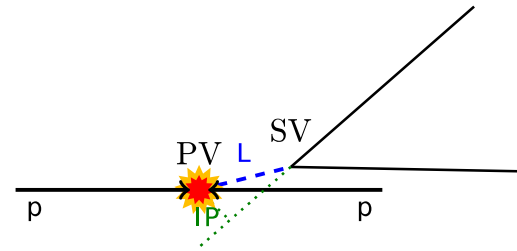


Beauty and charm decays

Beauty Hadrons



Charm Hadrons



- $B^{\pm/0}$ mass ~ 5.3 GeV
→ Daughter $p_T \mathcal{O}(1$ GeV)
- $\tau \sim 1.6$ ps \rightarrow flight distance ~ 1 cm
- Detached muons from $B \rightarrow J/\psi X$, $J/\psi \rightarrow \mu^+\mu^-$
- Displaced tracks with high p_T
- $D^{\pm/0}$ mass ~ 1.9 GeV
→ Daughter $p_T \mathcal{O}(700$ MeV)
- $\tau \sim 0.4$ ps \rightarrow flight distance ~ 4 mm
- Also produced from B decays

PV: Primary vertex
SV: Secondary vertex
IP: Impact parameter: distance between point of closest approach of a track and a PV

LHCb detector, 2011 - 2018

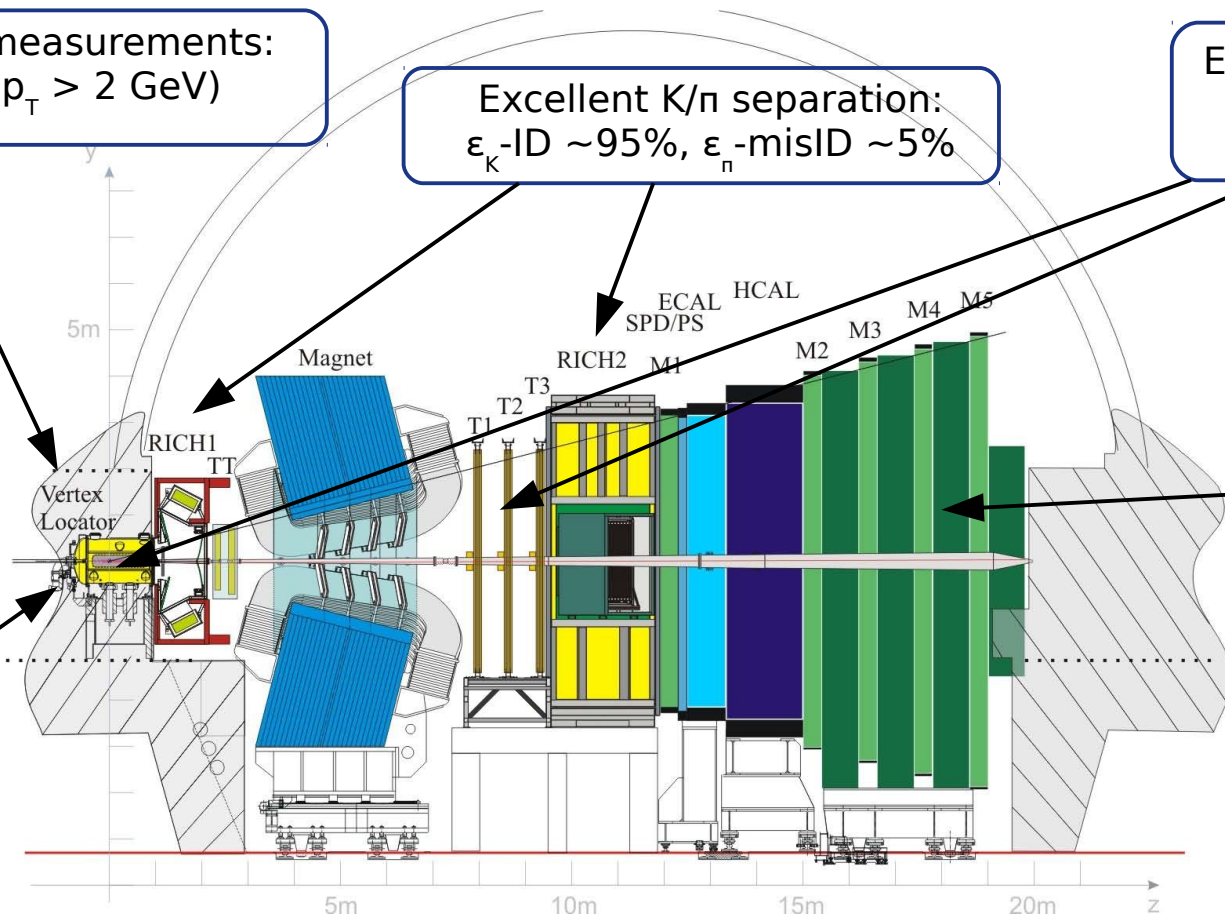
Precise vertex measurements:
 $\sigma_{IP} = 20 \mu\text{m}$ ($p_T > 2 \text{ GeV}$)

Excellent K/n separation:
 $\epsilon_K\text{-ID} \sim 95\%$, $\epsilon_n\text{-misID} \sim 5\%$

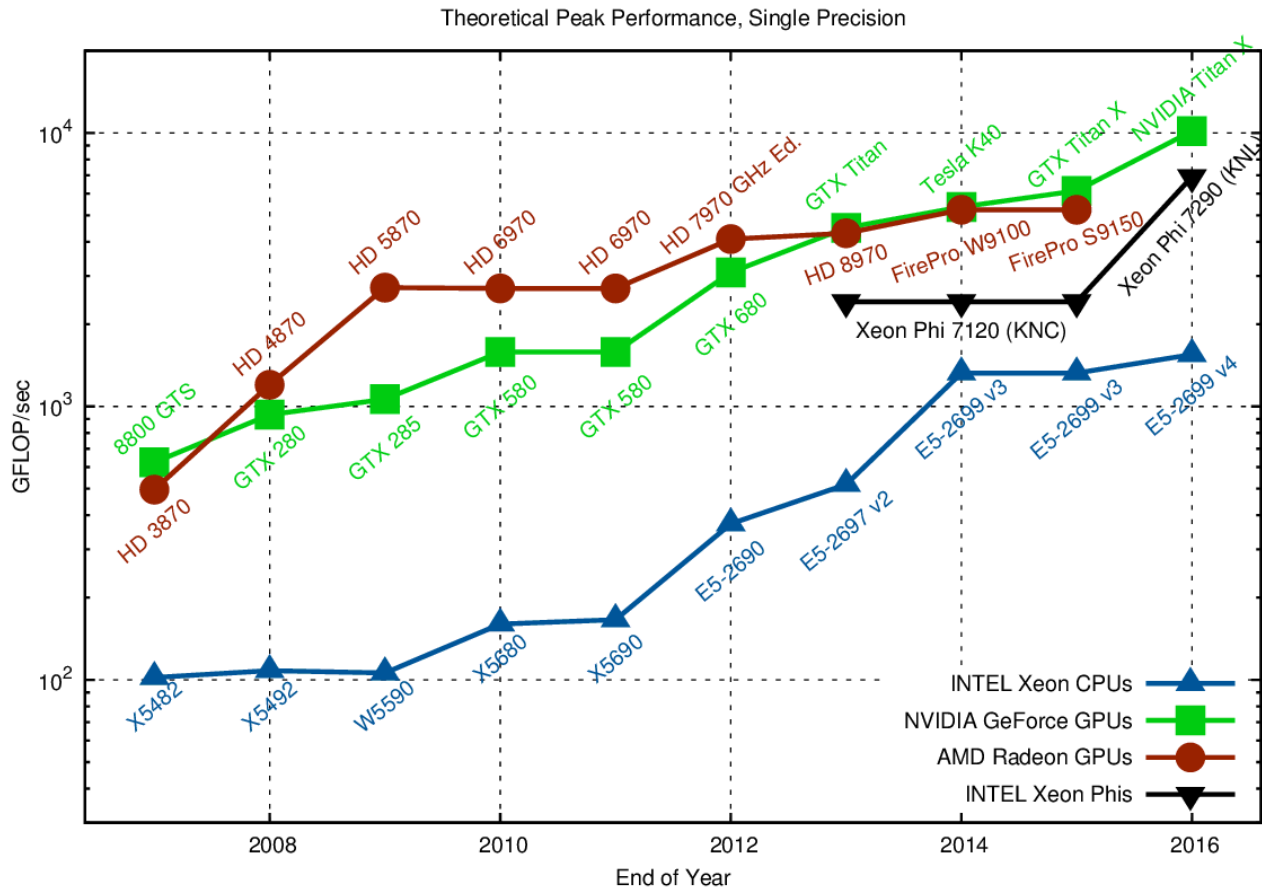
Excellent momentum resolution:
 $\Delta p/p \sim 0.5\text{-}1\%$

Excellent decay time resolution:
 $\sigma_\tau \sim 45 \text{ fs}$
for b hadrons

Excellent muon Identification:
 $\epsilon_\mu\text{-ID} \sim 97\%$



GPU performance over time



Throughput of x86 HLT1

