



# High Level Trigger of Belle II experiment

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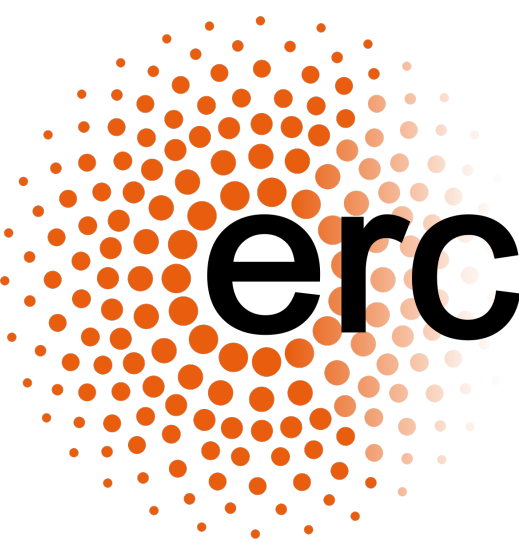


GDR-InF Annual workshop 2022



*Valerio Bertacchi, Karim Trabelsi, Vidya Vobbilisetti*

2 November 2022



# Belle II experiment at SuperKEKB collider

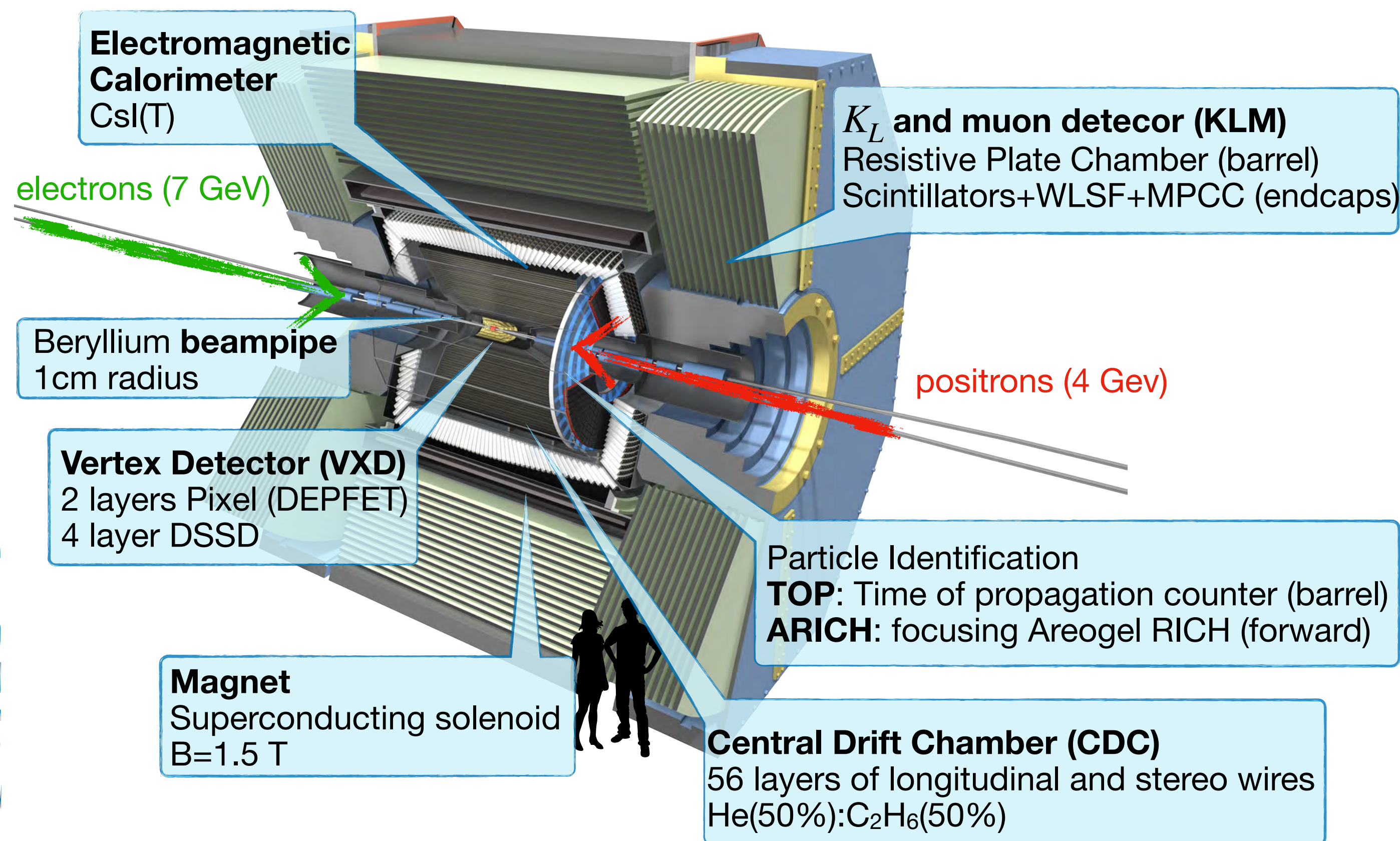
## SuperKEKB

- Target peak luminosity:  $6 \cdot 10^{35} \text{ cm}^{-2}\text{s}^{-1}$   
(x 30 of KEKB)
- Target integrated luminosity:  $50 \text{ ab}^{-1}$   
(x 70 Belle at  $\Upsilon(4S)$ )

## Current Status

- complete detector data taking started in 2019
- Current peak luminosity  $4.7 \cdot 10^{34} \text{ cm}^{-2}\text{s}^{-1}$  (reached the 22/06/2022)
- current integrated luminosity:  $\sim 424 \text{ fb}^{-1}$  ( $\sim$ Babar $\sim$ 0.5 Belle)
- Long Shutdown 1 (LS1) started in July

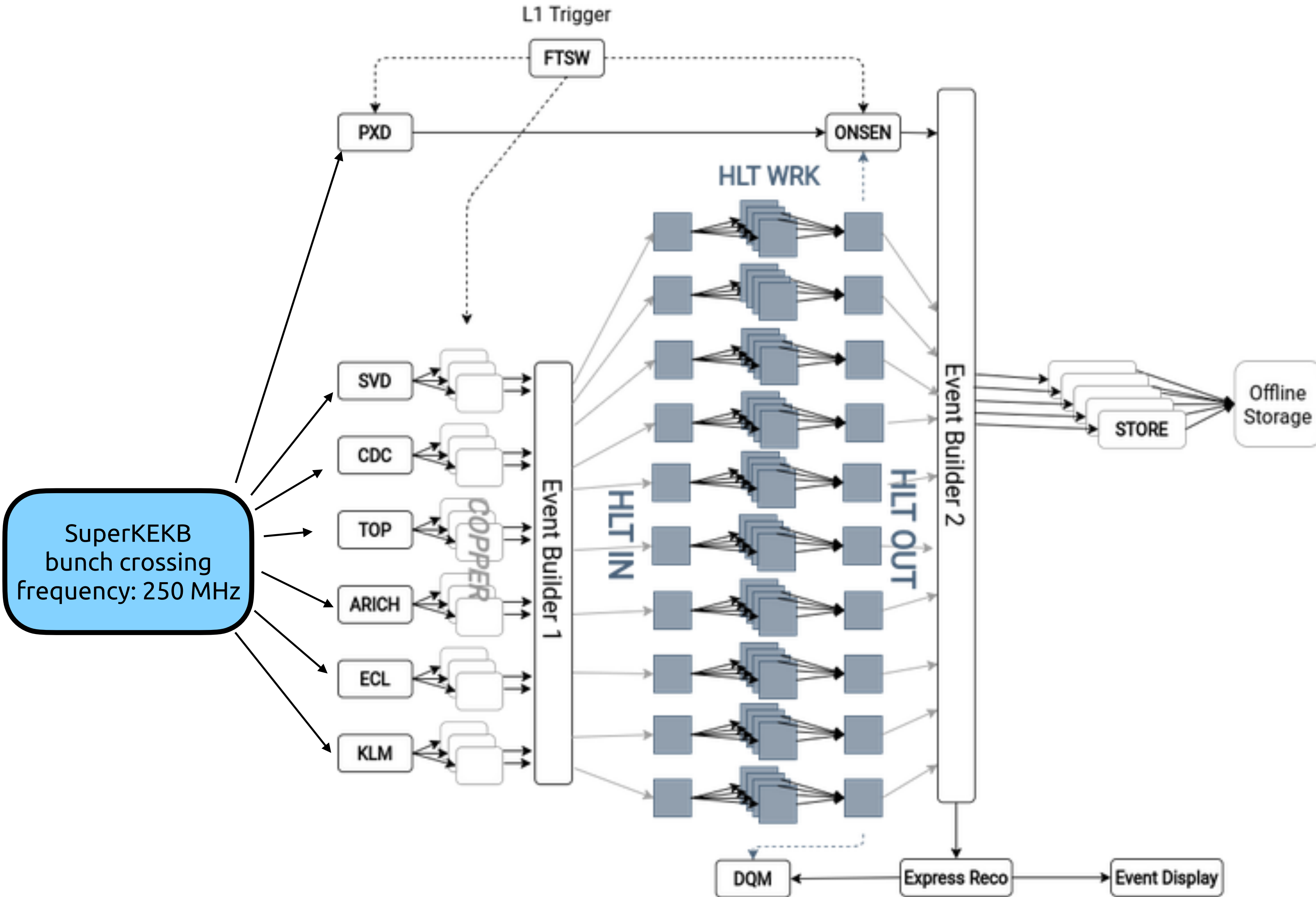
## Belle II



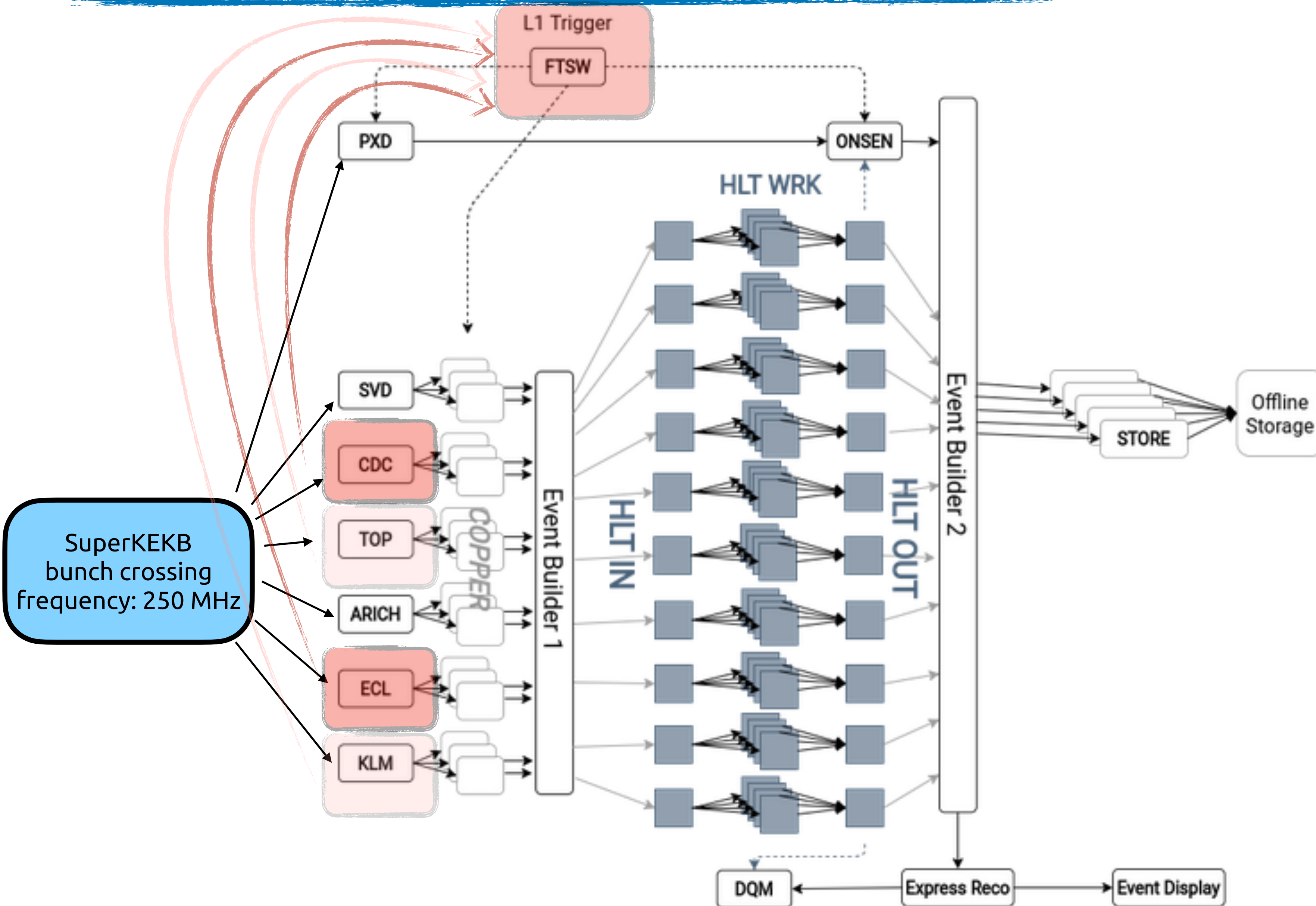
[Belle II Technical Design Report, arXiv:1011.0352]



# Belle II trigger dataflow



# Belle II trigger dataflow: Level 1 trigger

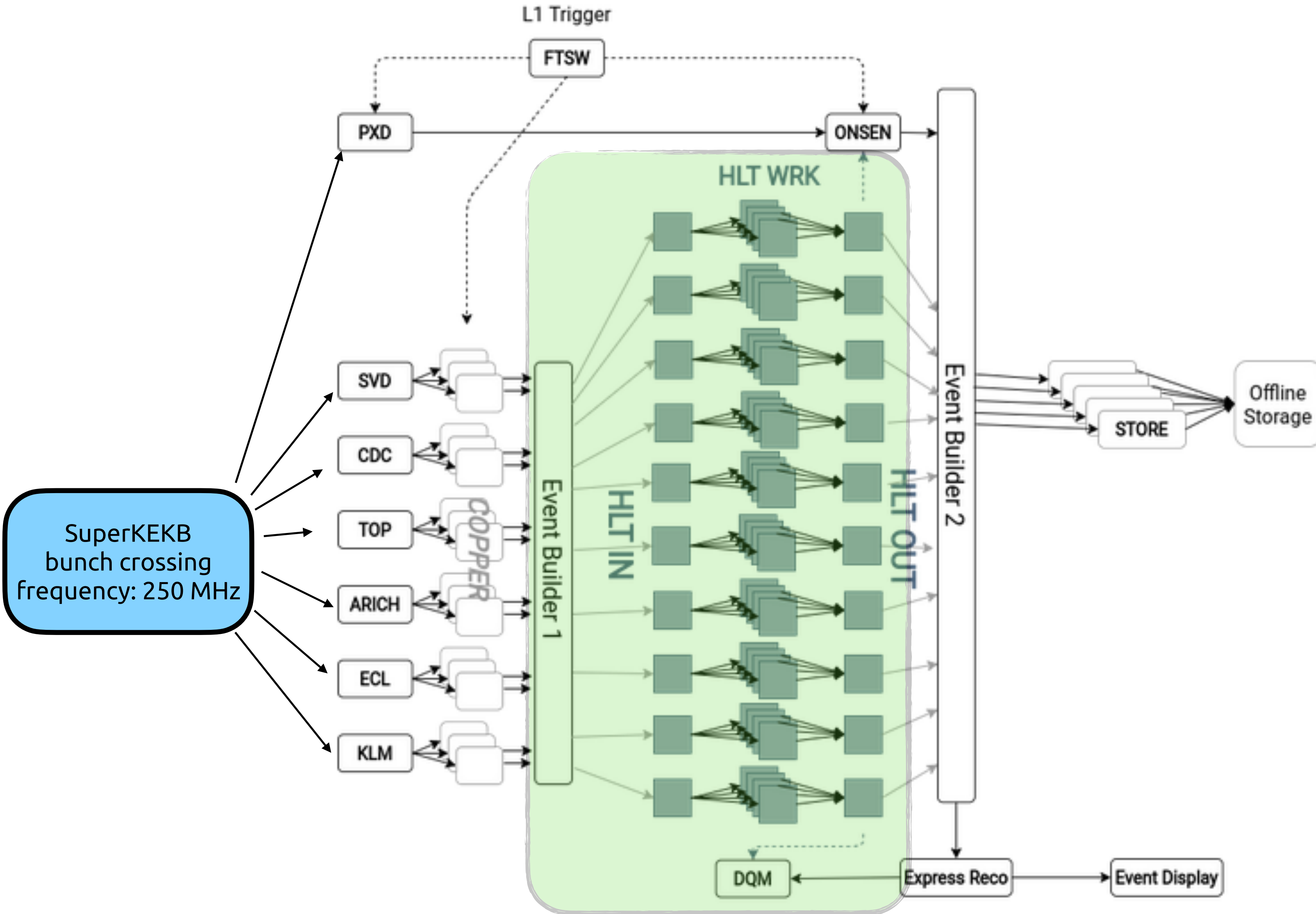


## L1 Trigger

- Purpose: **suppress the background** rate, retaining ~100% of  $b\bar{b}$  events with high efficiency also for  $c\bar{c}$  and  $\tau^+\tau^-$
- Output rate:
  - Now: about **10 kHz**
  - Expected at target luminosity: 30 kHz
- latency: few  $\mu\text{s}$
- Strategy:
  - processing on **FPGA**,
  - using OR of different, **orthogonal**, trigger lines (**CDC, ECL**)  $\Rightarrow$  conservative approach



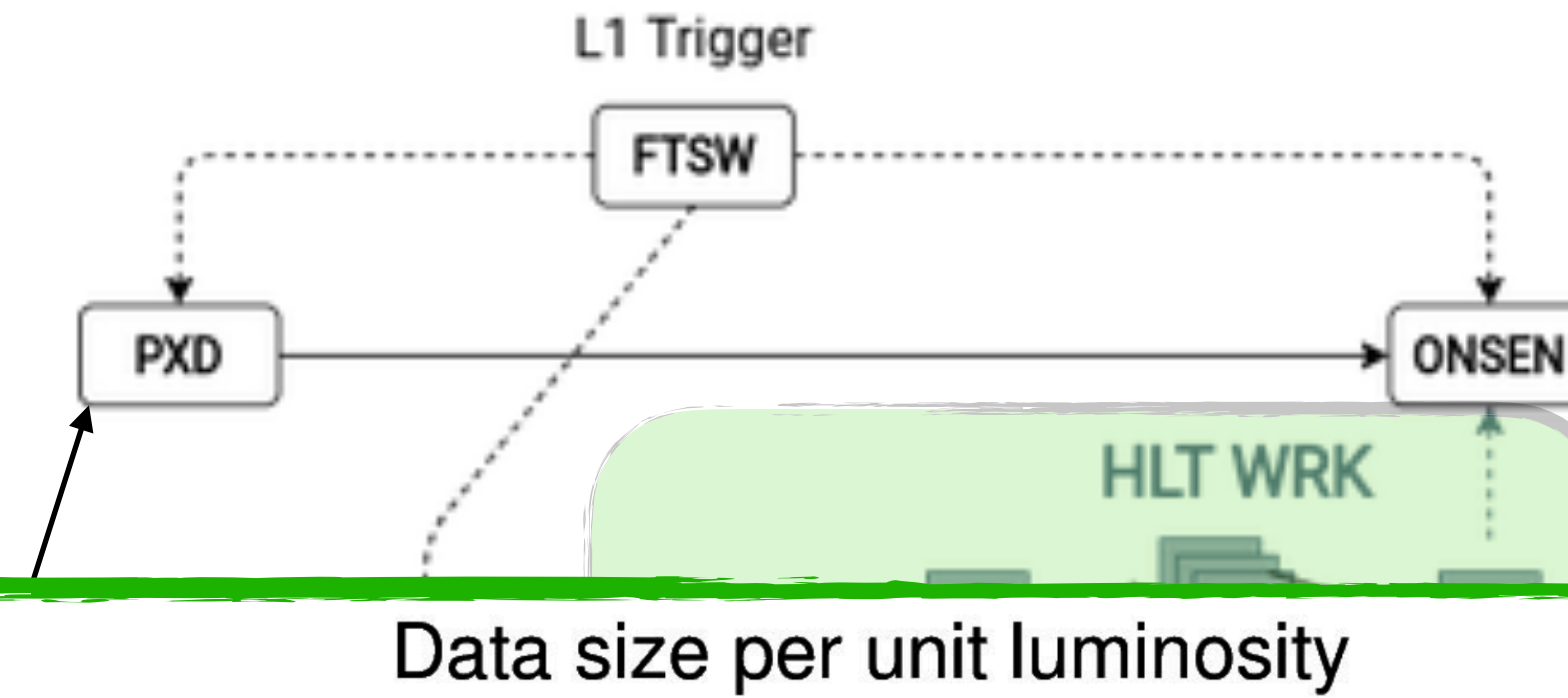
# Belle II trigger dataflow: HLT



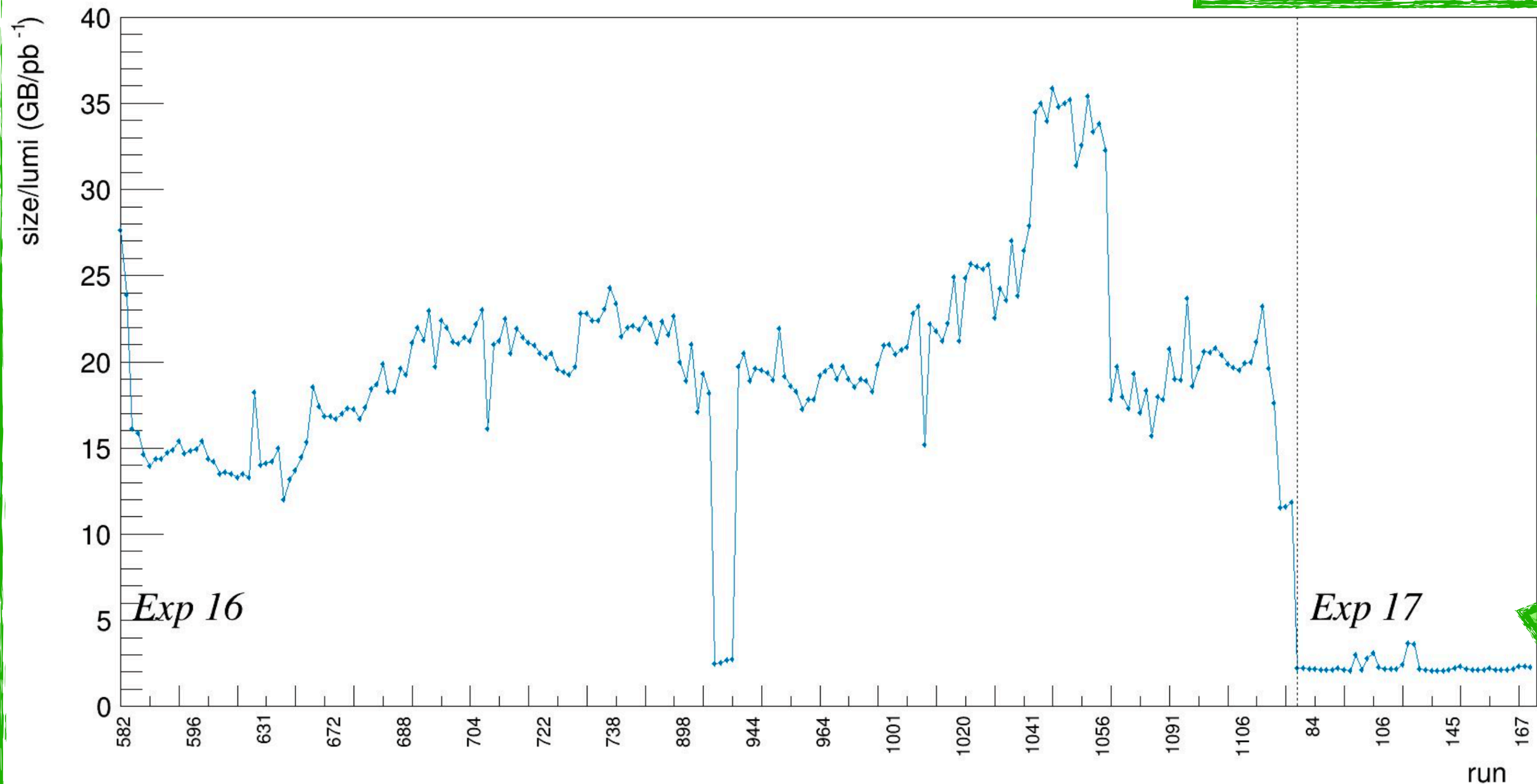
## HLT

- Purpose:
  - reduce the trigger rate to a **storable rate**
  - run **DQM**
  - produce the **ROIs** for the PXD
  - assign the skim flag
- Output rate: ( $\epsilon \simeq 10 - 20\%$ )
  - Now: about **2 kHz**
  - Expected at target luminosity: 6 kHz
- **Processing time: 300 ms**
- **Budget time** ( $N_{\text{proc}}/L1$  rate): **400 ms**
- Strategy: **fast reconstruction** on CPU
- hardware:
  - Now: 10 units, about 500 cores per unit--> **2 x 4800 processors**
  - After LS1: +3 units (to sustain 20 kHz input rate)

# Belle II trigger dataflow: HLT



The HLT event selection has been turned on in 2021, showing immediately its data reduction capability



## HLT

- Purpose:
  - Reduce the trigger rate to a **storable** level
  - Select the **ROIs** for the PXD
- assign the skim flag
- Output rate: ( $\epsilon \simeq 10 - 20\%$ )
  - Now: about **2 kHz**
  - Expected at target luminosity: **6 kHz**
- **Processing time: 300 ms**
- **Budget time ( $N_{\text{proc}}/\text{L1 rate}$ ): 400 ms**
- Strategy: **fast reconstruction** on CPU
- hardware:
  - Now: 10 units, about 500 cores per unit--> **2 x 4800 processors**
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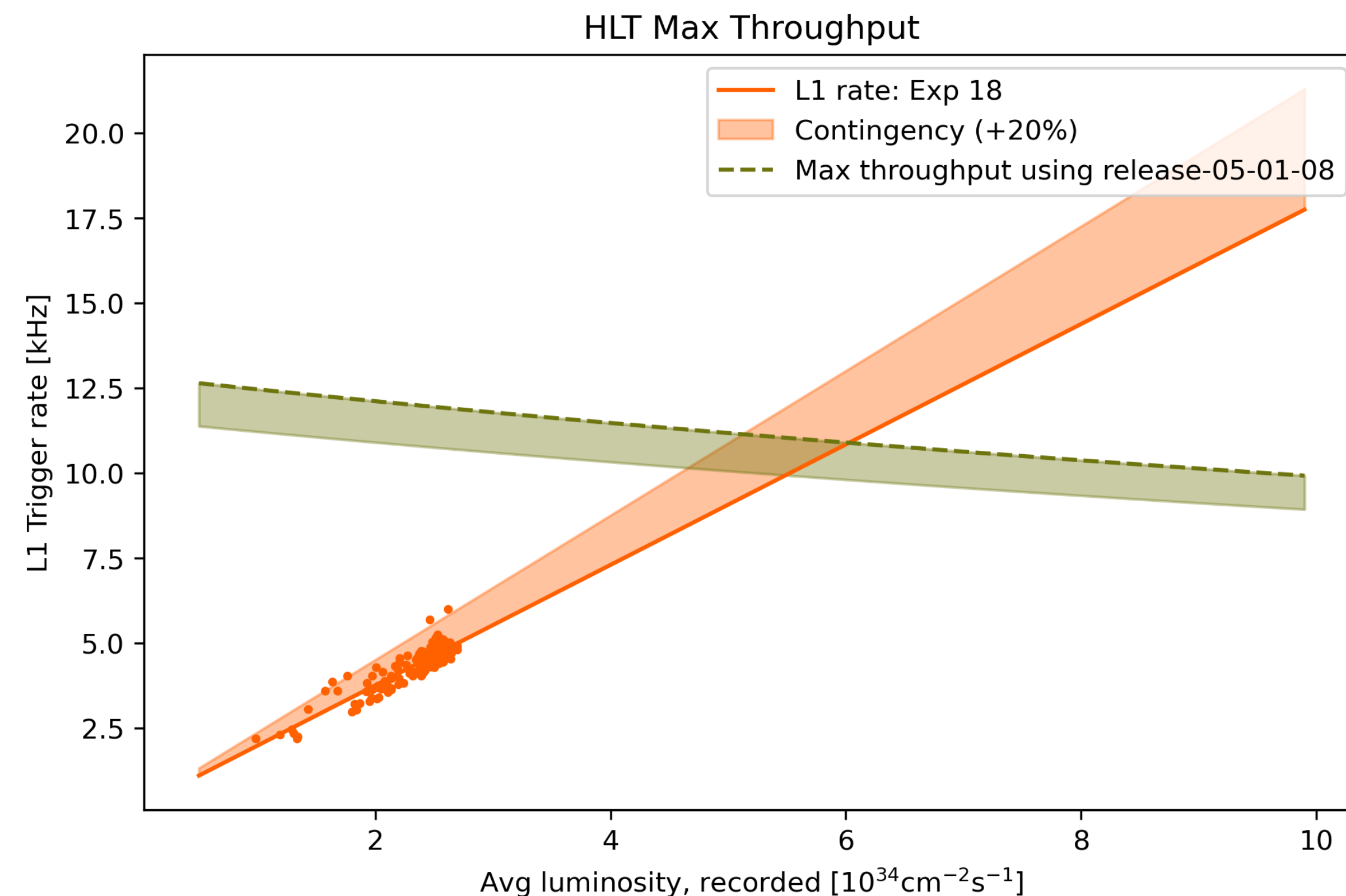




# HLT limits (exp 18 ~ 2021 data taking)

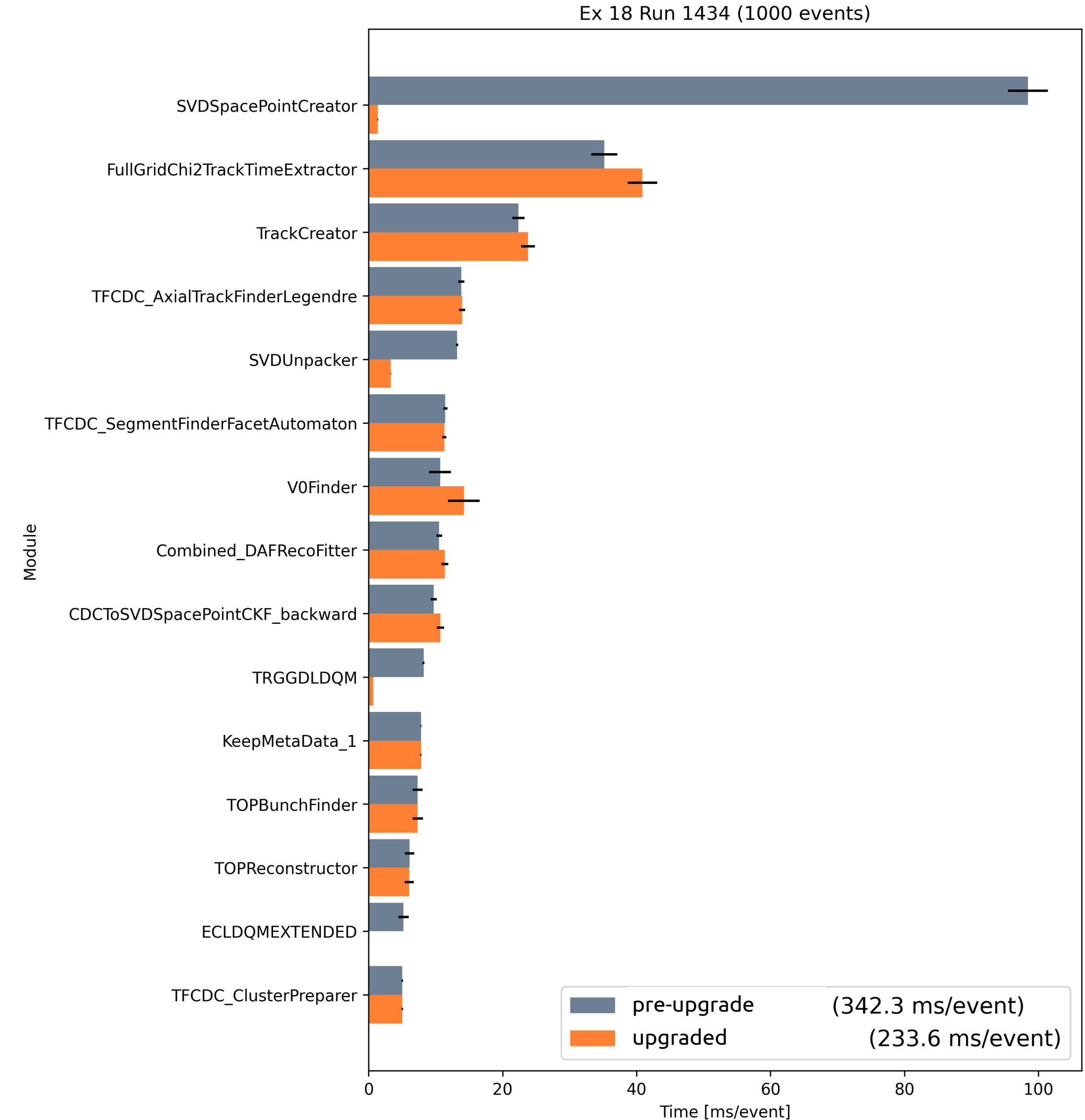
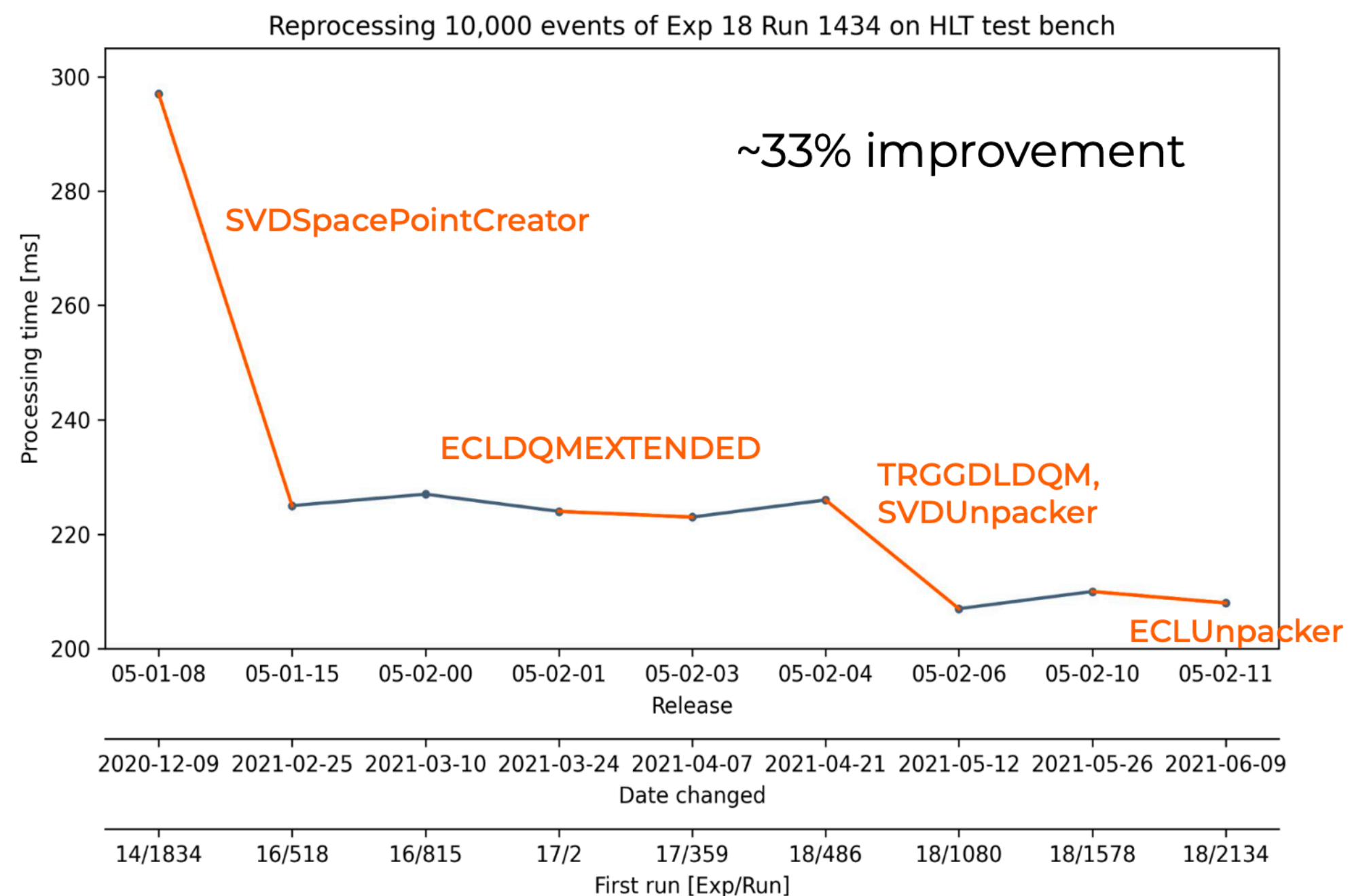
$$\text{Throughput} = N_{\text{processes}} / \text{process time}$$

- L1 output (HLT input) **increase with luminosity** given the increased event rate
- Throughput decrease with luminosity given the **increasing complexity of the events** (higher background) which requires longer processing time
- In 2021 ( $\mathcal{L} = 2 \cdot 10^{34} \text{cm}^{-2} \text{s}^{-1}$ ) Belle II realised that the conditions are not sustainable to reach the LS1
- Optimization of HLT is needed to increase the throughput (**decrease the processing time**)



# First optimization before the Long Shutdown 1

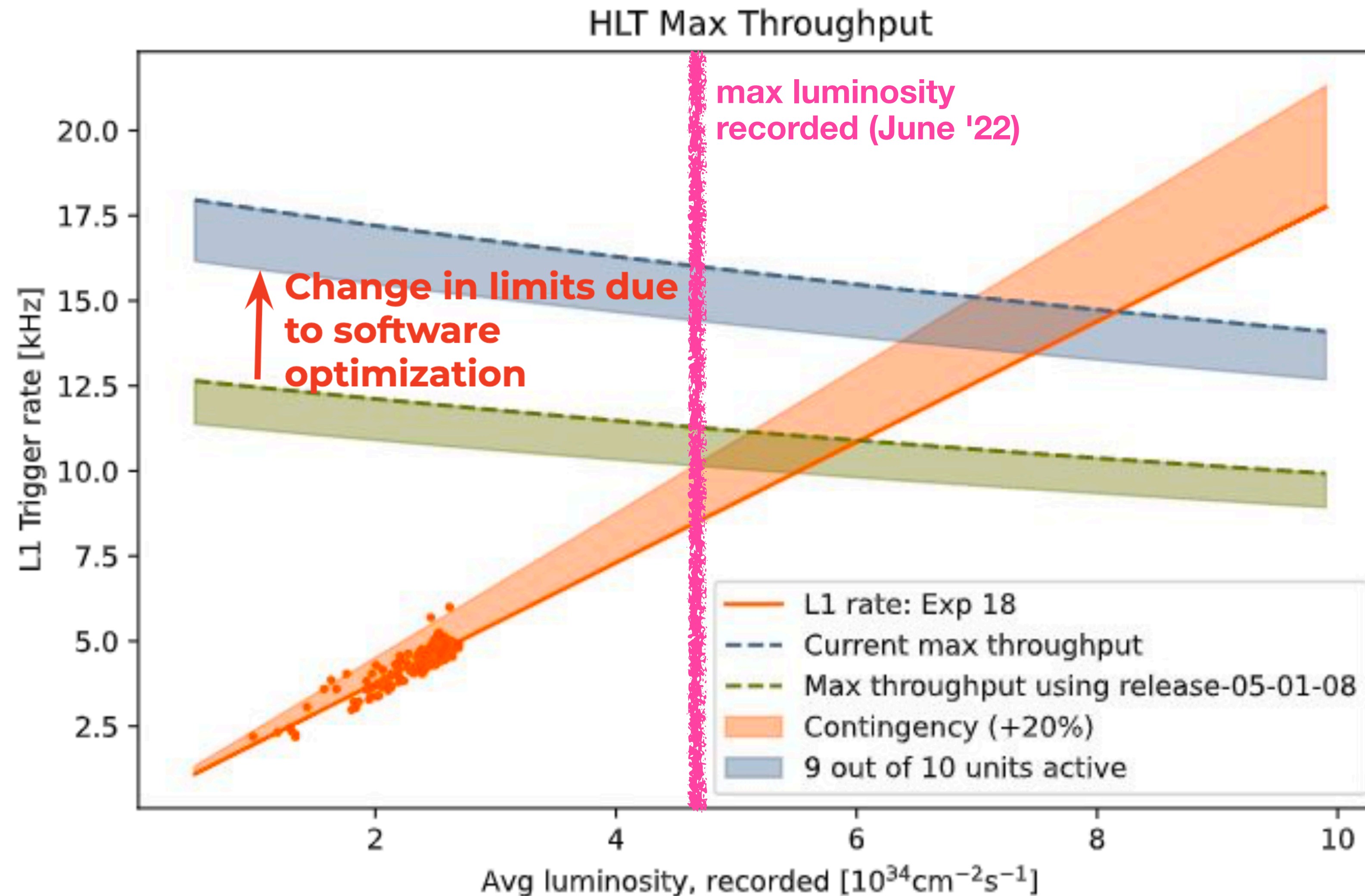
- Strategy: optimize the code, **producing identical results**
- Constraint:
  - implemented during data taking to **survive until LS1**
  - the HLT decision, the DQM, the skim **cannot change** to keep consistent data taking
- Optimized the ROOT object management





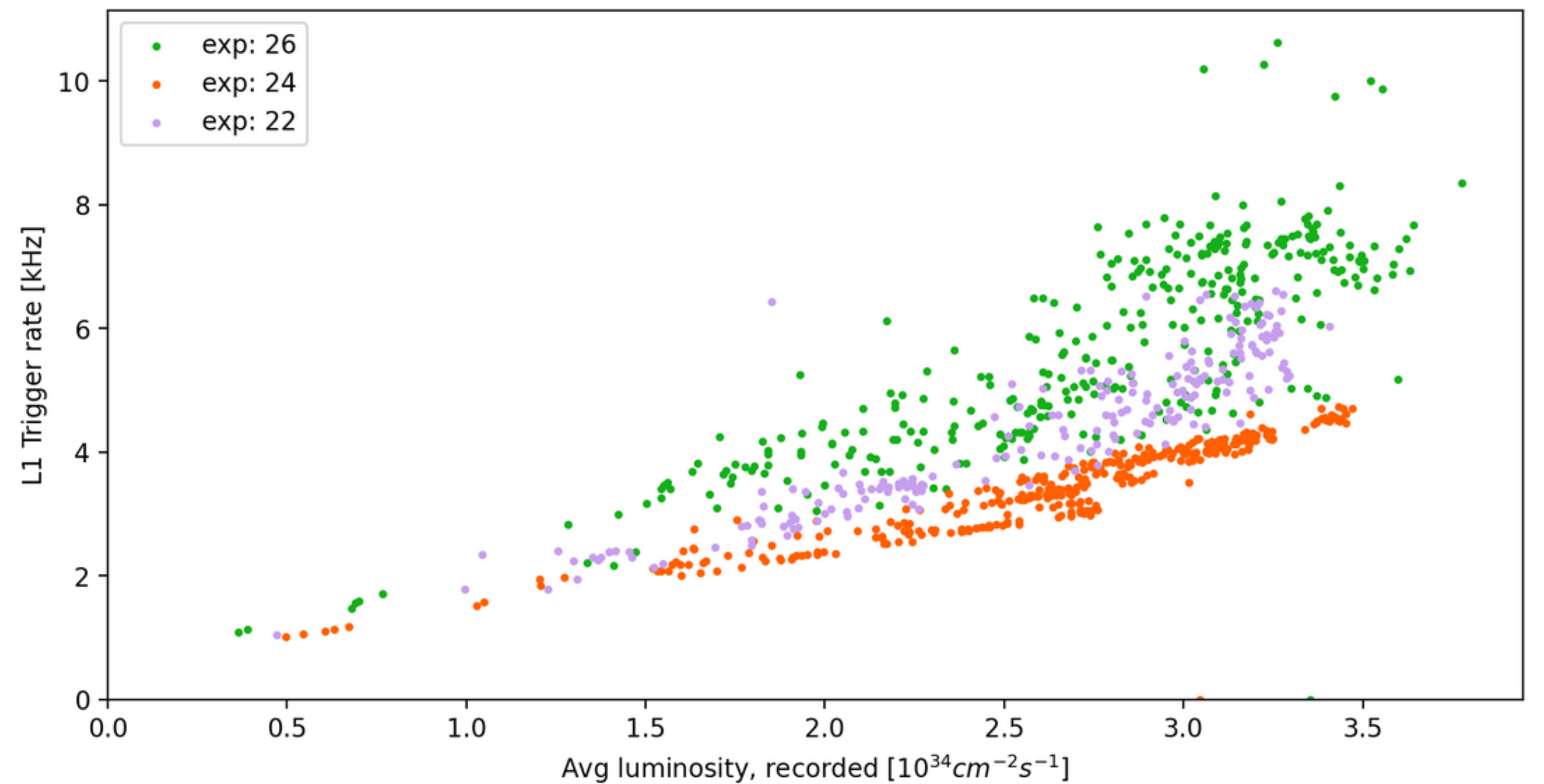
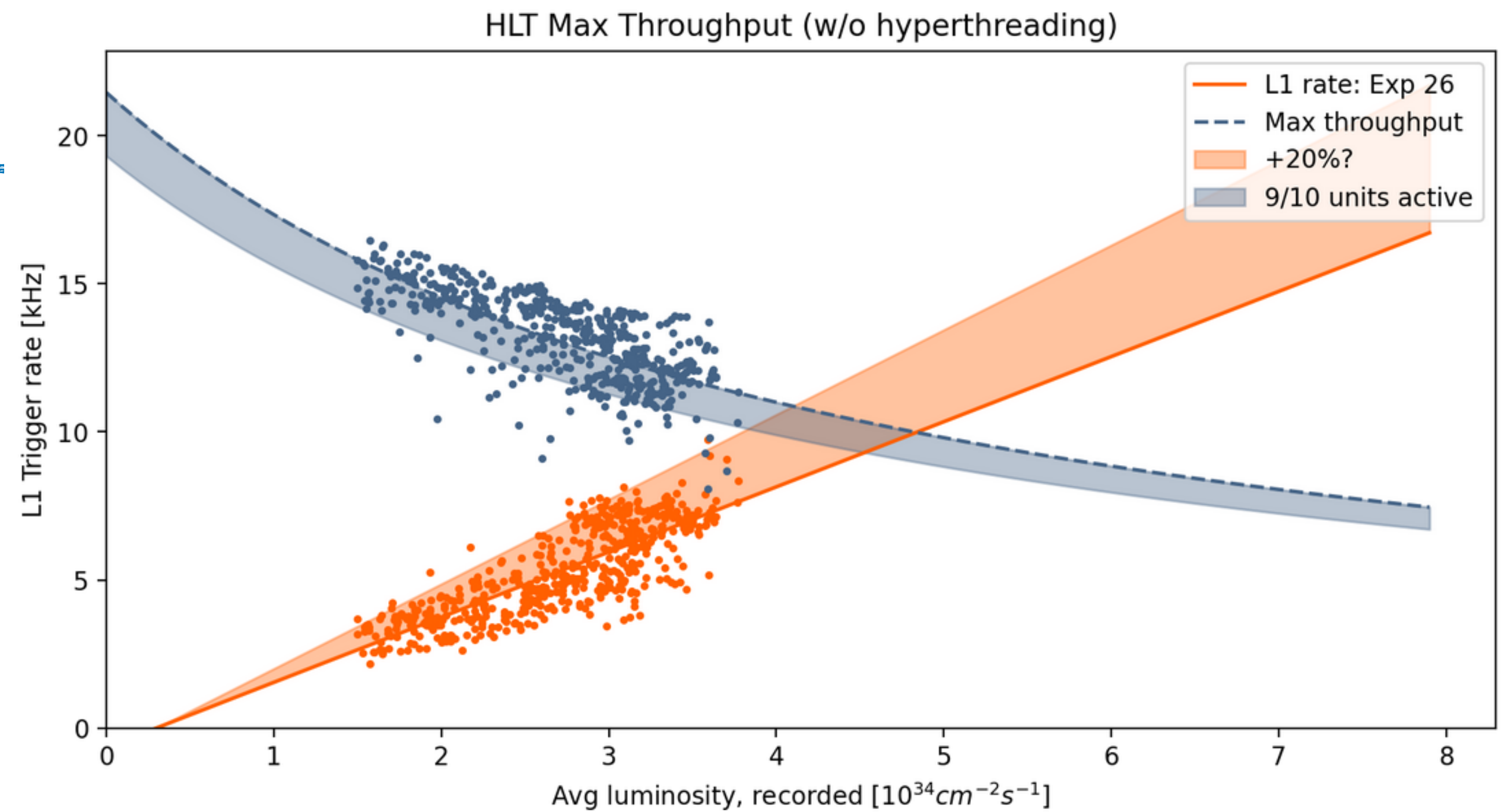
# First optimization impact

- Thanks to this optimization work we will survive until LS1!



# HLT current limits

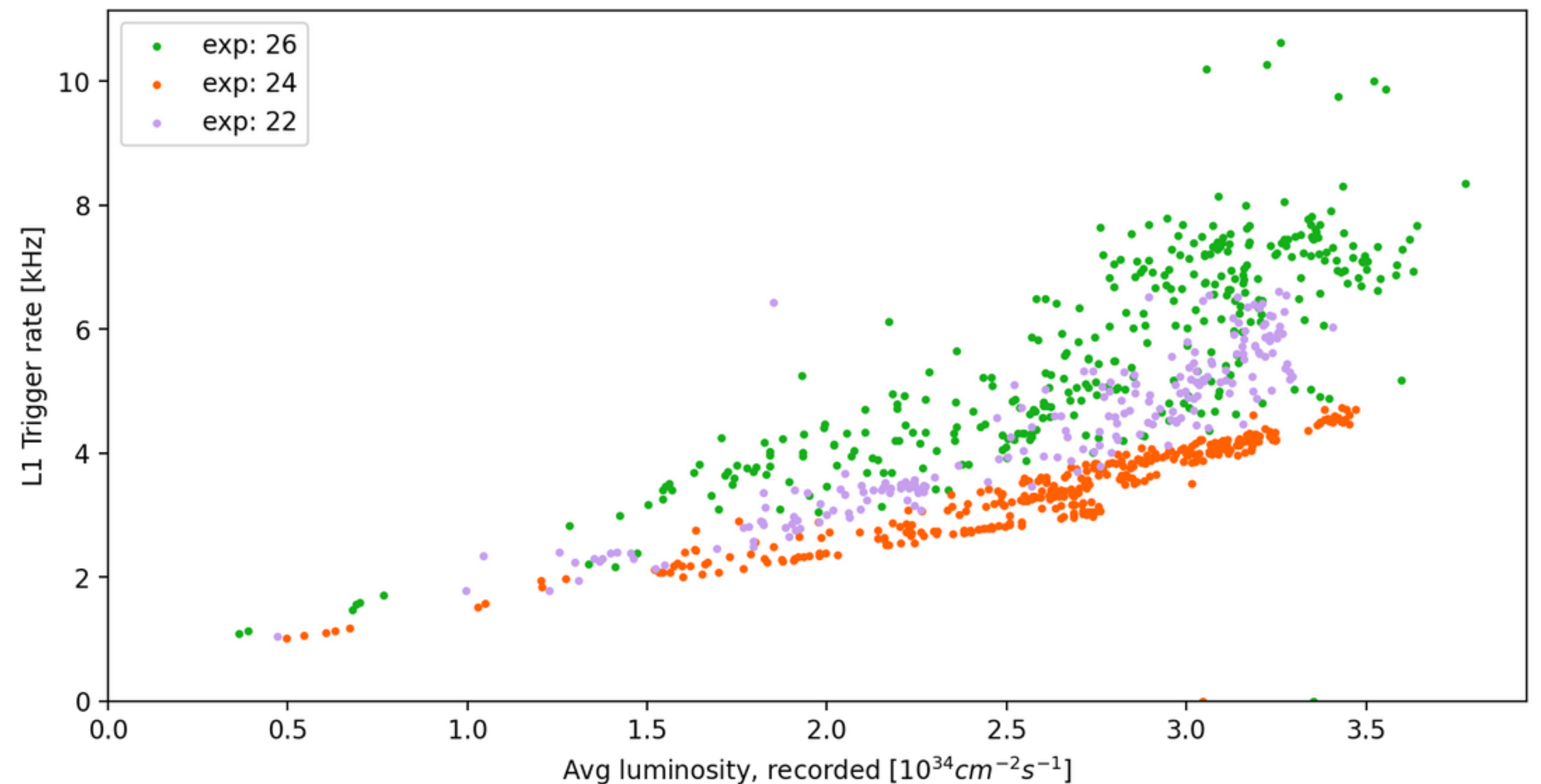
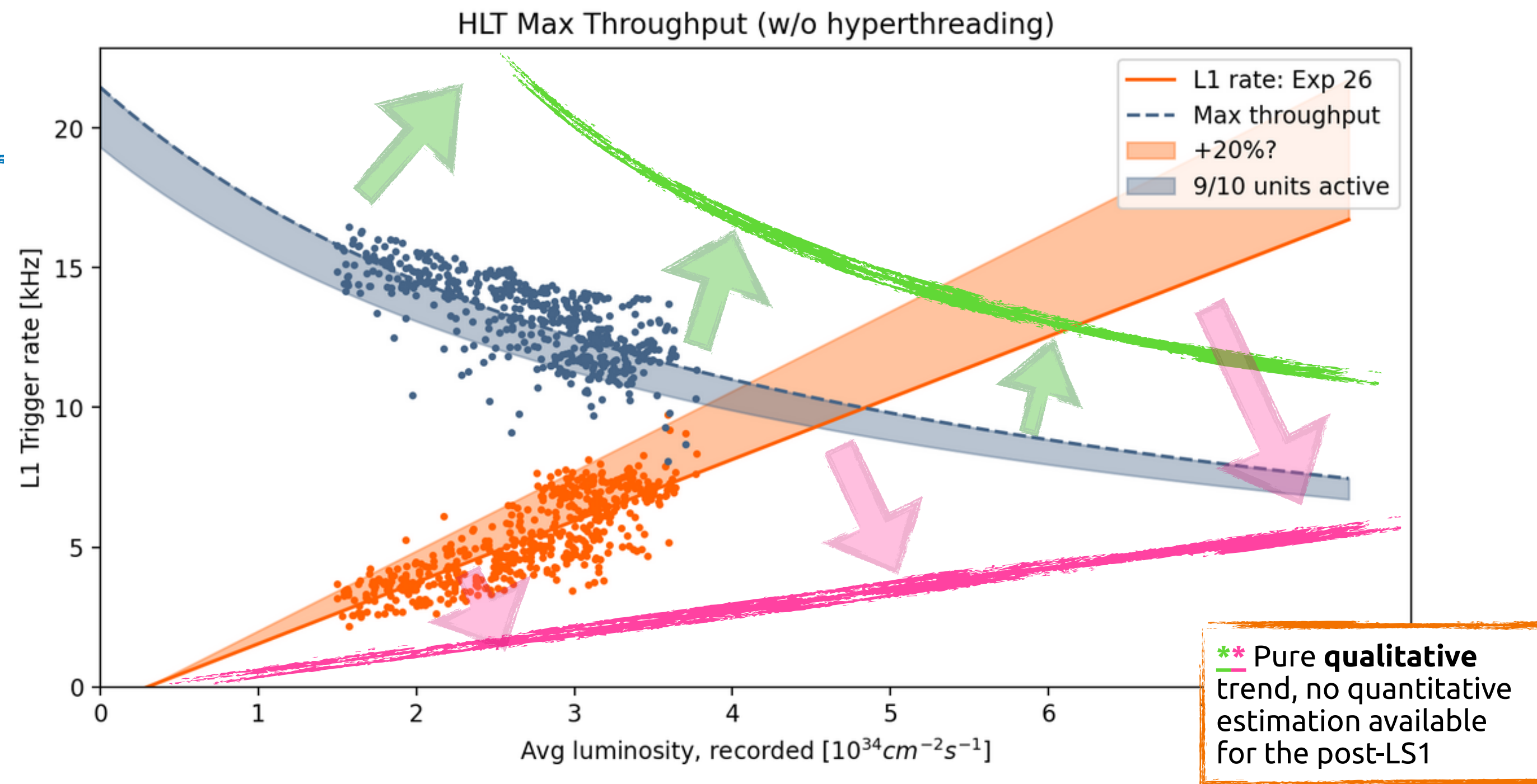
- But we arrived very close and the trend is not promising...





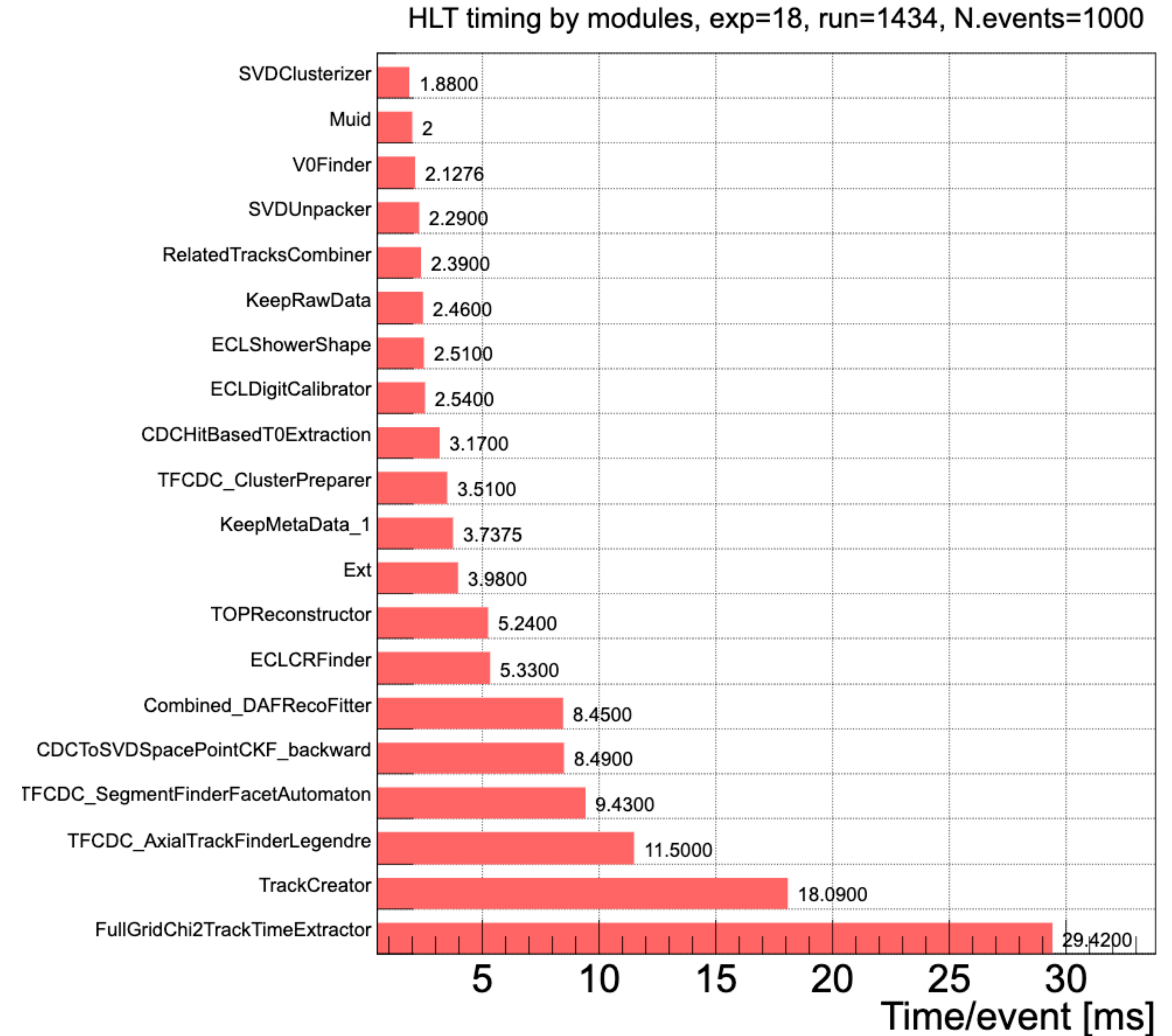
# HLT current limits

- But we arrived very close and the trend is not promising...
- After LS1 we will have:
  - **new collimators** (reduce input rate overall and bkg in  $b\bar{b}$  events)  $\Rightarrow$  Reduce L1 output
  - **3 additional HLT units**  $\Rightarrow$  increase Throughput
- However further HLT optimization is needed:
  - as **safety factor**
  - to reduce the **computing burden**
  - indirect impact on **MC production** and **data reprocessing**



# Further optimization is needed

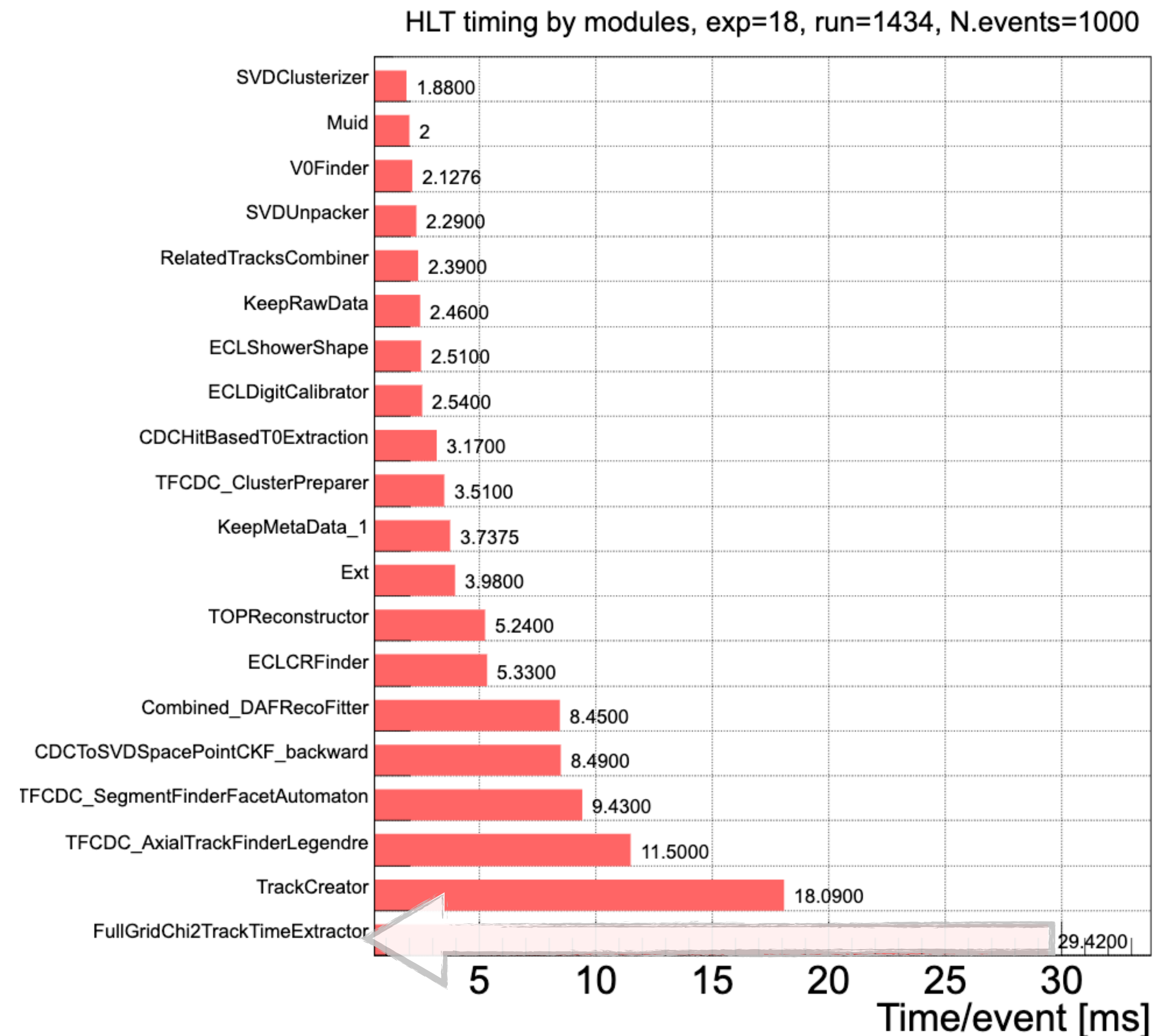
- Strategy: **modify the reconstruction** strategies, allowing also *small degradation*, to save processing time





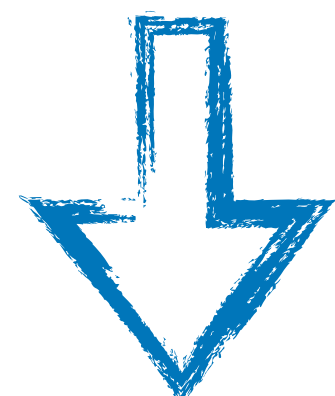
# Further optimization is needed

- Strategy: **modify the reconstruction** strategies, allowing also *small degradation*, to save processing time
- First achieved result: CDC Event Time estimation has been **replaced with SVD Event Time** estimation ⇒ 2000 times faster [\[see backup\]](#)
- Next step: reducing tracking processing time (**track fitting**)

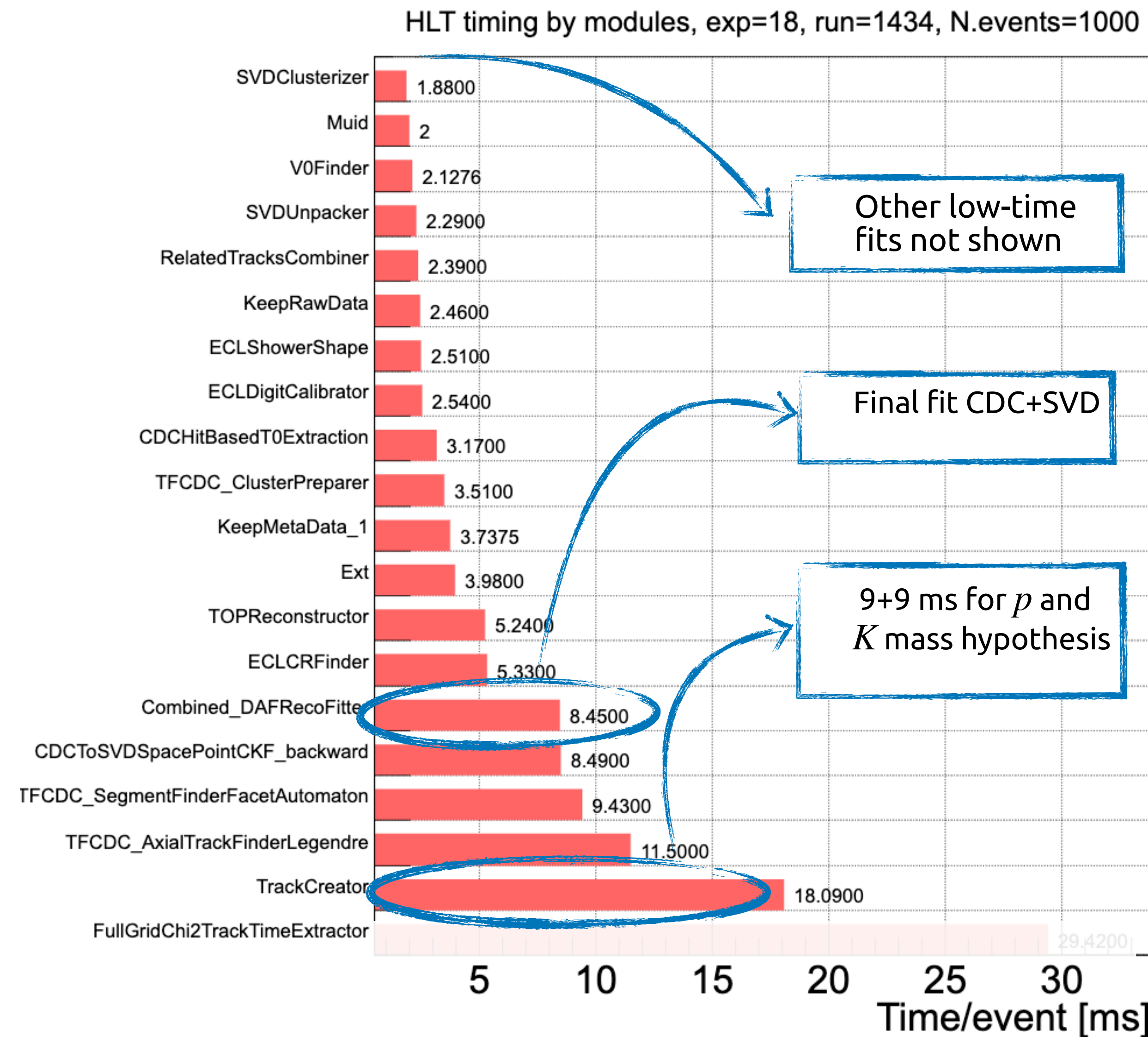


# Track Fitter calls

- The fitter is **called ~5 times per track**, using a Deterministic Annealing Filter (**DAF**)
- With the current configuration the DAF takes **15 ms/track** for each call



The DAF its optimization has a **radical impact** on reconstruction CPU time (and tracking performance)





# DAF

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- For each call of the fitter the DAF (*Deterministic Annealing Filter*) is called
- The purpose of the DAF is to remove from the fit the **outlier hits** to improve the fit accuracy
- Method:
  - The DAF is **assigning weights** (in the range  $[0,1]$ ) to each hit, accordingly to the residuals between the measurement and the Kalman Filter prediction.
  - The fit is **repeated multiples times lowering an annealing temperature**
  - A **convergence criterion** is defined, based on the variation of the weights and the p-value of the fit (see next slide)
- Status: the **DAF has been never optimized**, and in the current configuration the convergence is not tuned  $\Rightarrow$  **extremely time consuming**

# DAF demonstrative optimization

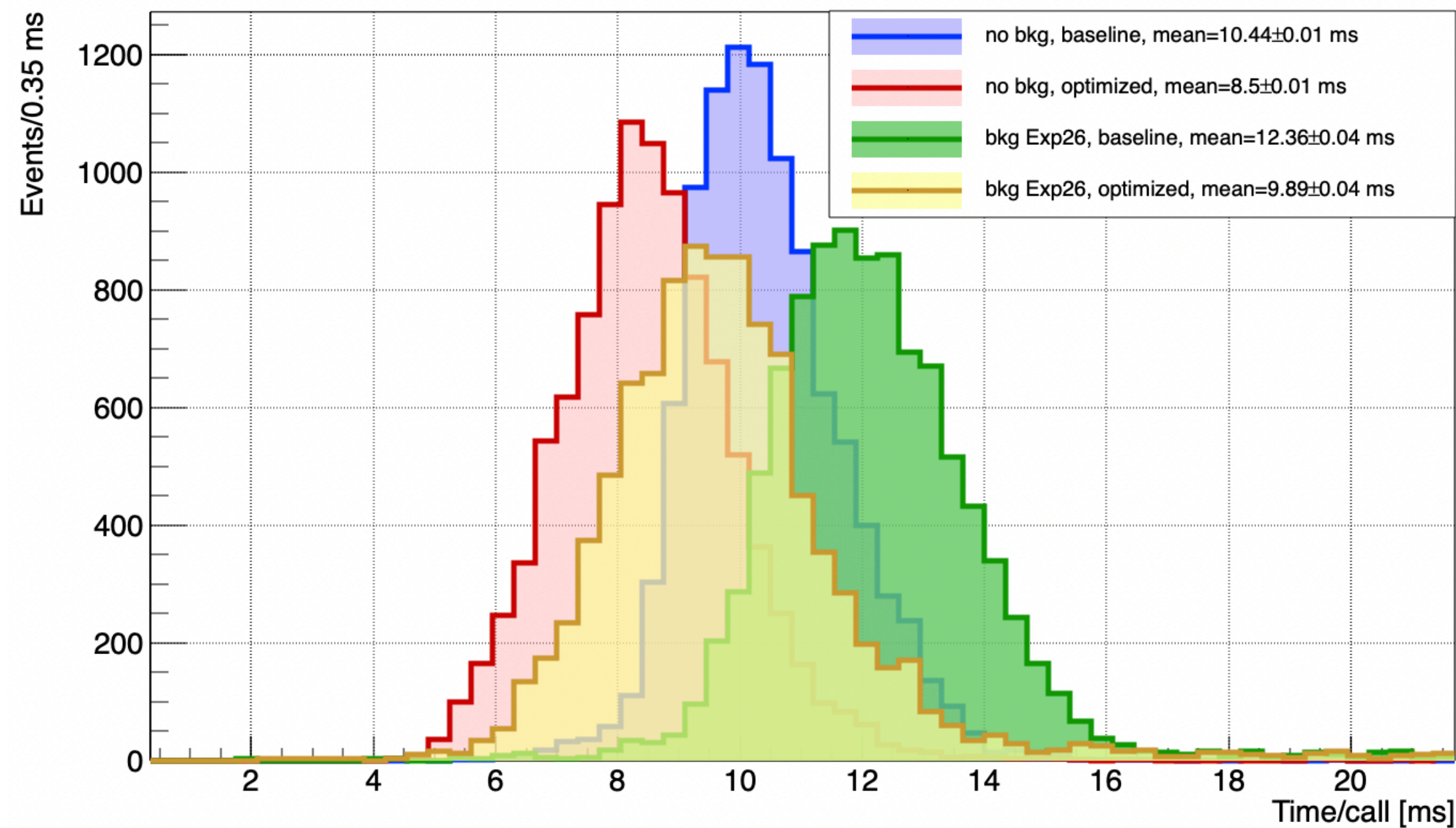
Test condition:

- Muon Gun
- CDC only tracking
- $p_T=1$  GeV
- $\theta = 70^\circ$

Changed some hyperparameters of the DAF [\[see backup\]](#):

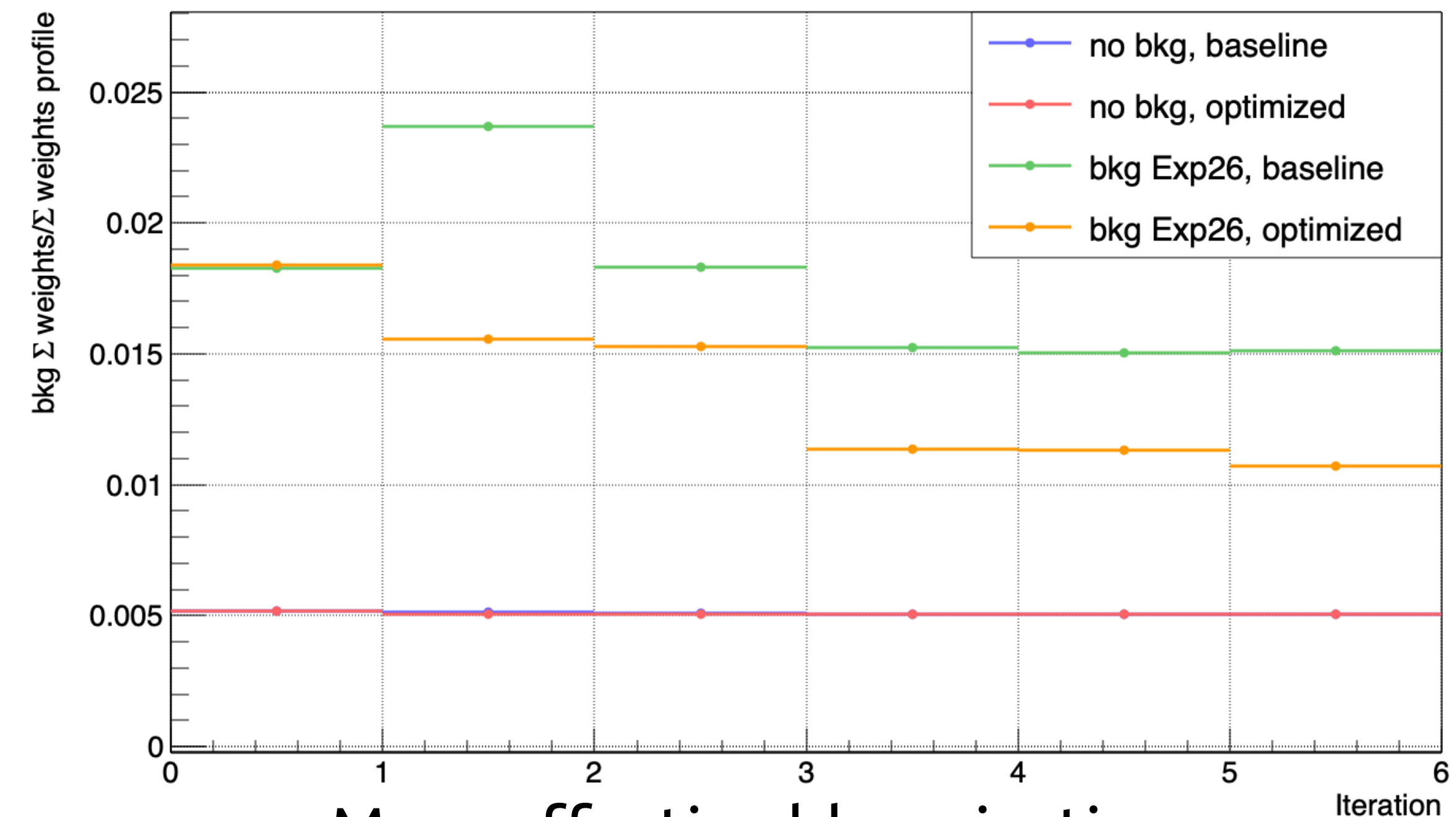
- to obtain reasonable **convergence behaviour** (use the iteration range, use mainly primary convergence criterion, exploit more wisely the p-value)
- having the CPU **time figure of merit**

DAFRecoFitter module CPU time



Better timing performance

Un-purity of the tracks

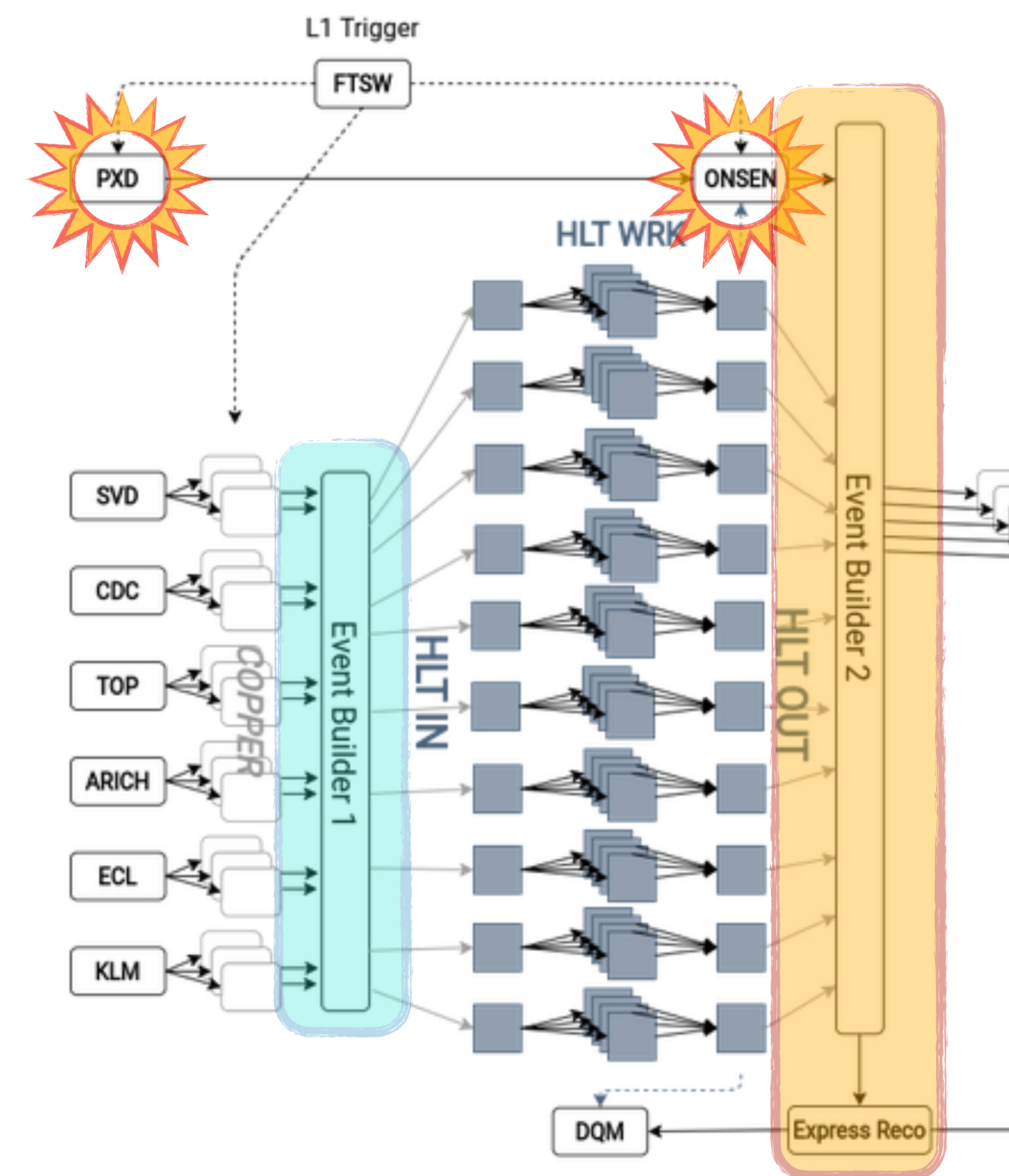


More effective bkg rejection  
(improving in high-bkg scenario)



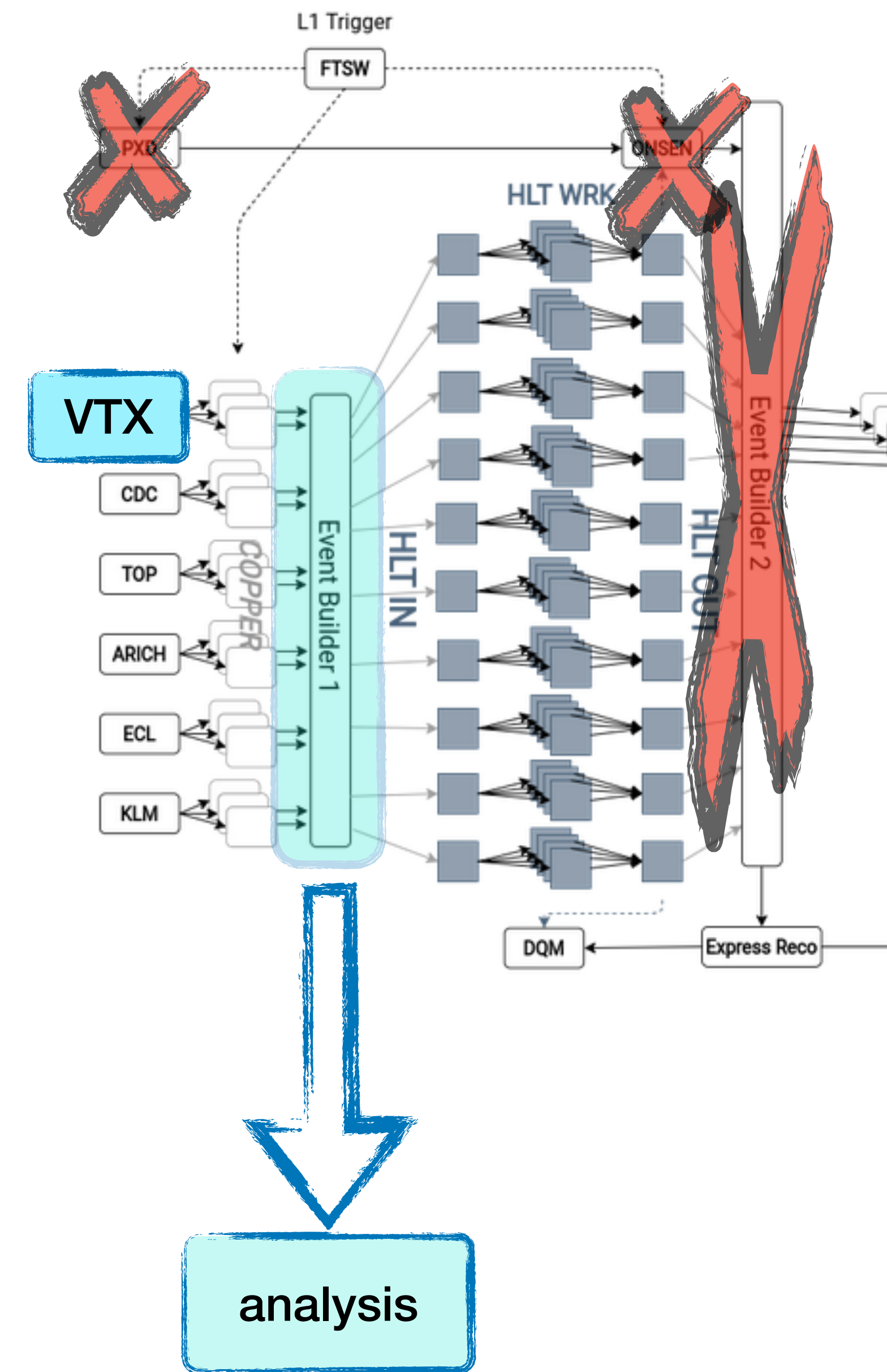
# The future of the HLT

- With current HLT scheme we already have a **full online reconstruct** with 2 missing elements:
  - **calibrations** with most updated condition: built and then applied using run-by-run information
  - **PXD**: too slow to be read or used online [\[see backup\]](#)



# The future of the HLT

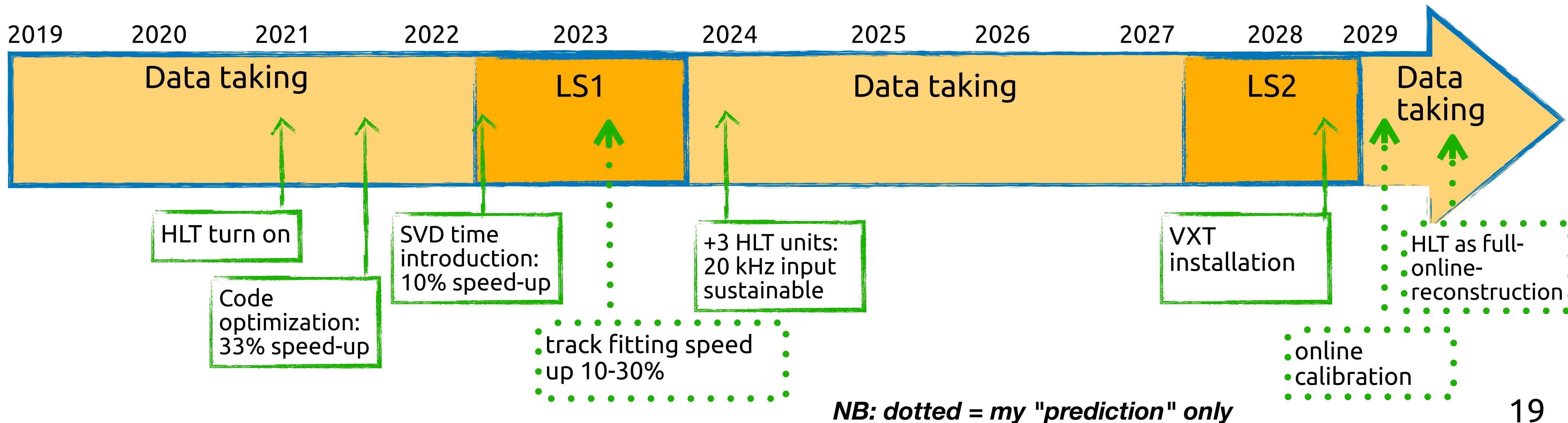
- With current HLT scheme we already have a **full online reconstruct** with 2 missing elements:
  - **calibrations** with most updated condition: built and then applied using run-by-run information
  - **PXD**: too slow to be read or used online [\[see backup\]](#)
- Can we change the scheme to use the HLT reconstruction as final one?
  - calibrations: with a **more stable detector (accelerator)** we can use previous run information to **calibrate online**
  - PXD: after the LS2 (2026-2027) we plan to replace the PXD+SVD with the **VTX: six-layer CMOS pixel detector**, which can be fully used at HLT level
- Advantages: **faster** and **tidier** dataflow, **online final** reconstruction





# Conclusions

- The HLT of Belle II is powerful tool to obtain close-to-final online reconstruction
- Given the increasing background the **HLT need constant optimization** to fulfil the timing constraints
  - Large room for improvement in the **track fitting** step
- Thanks to the HLT, with an upgrade of the Belle II vertex detector, Belle II can obtain a **ready-to-analysis online reconstruction** for free



# BACKUP SLIDES





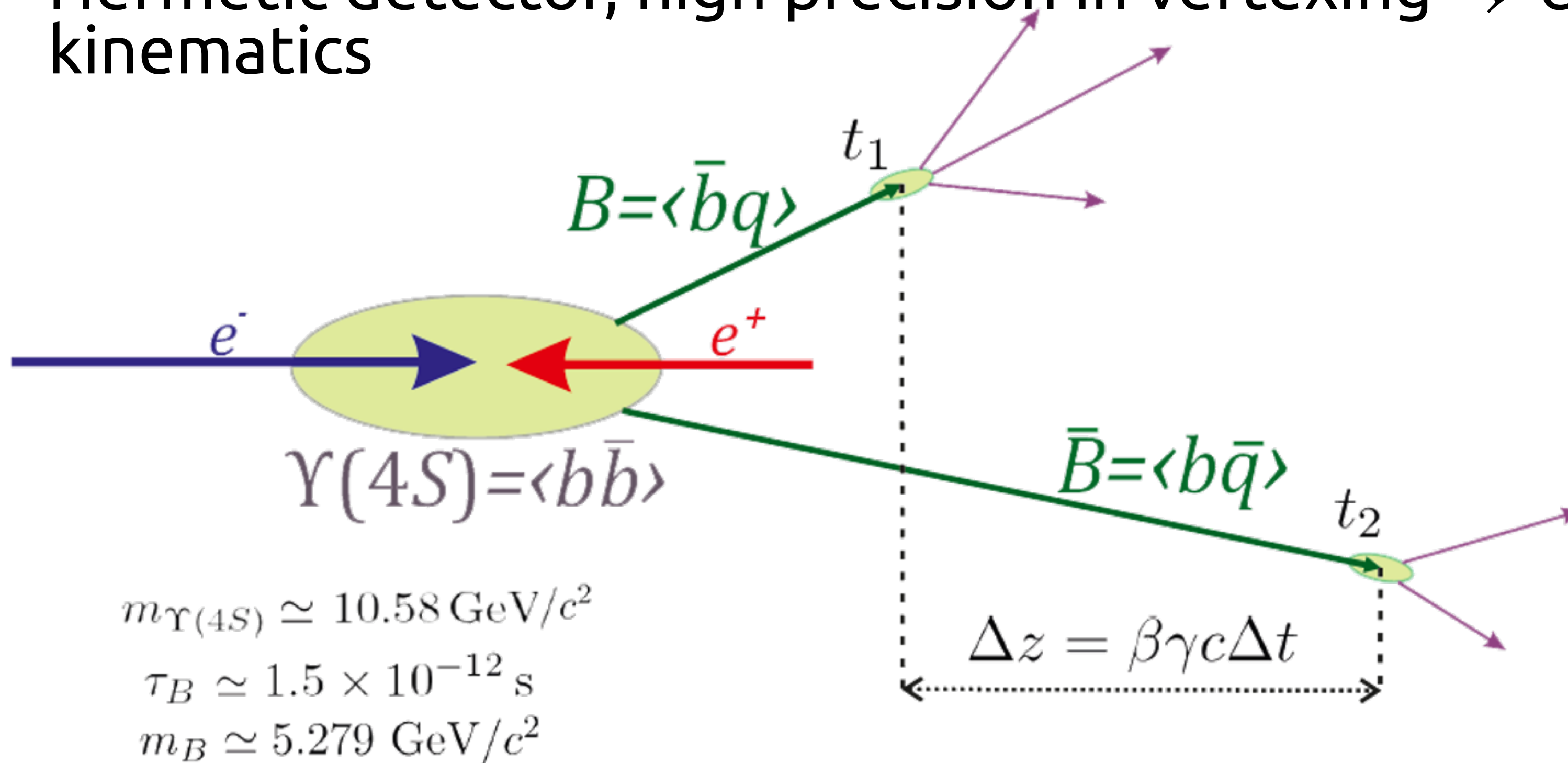
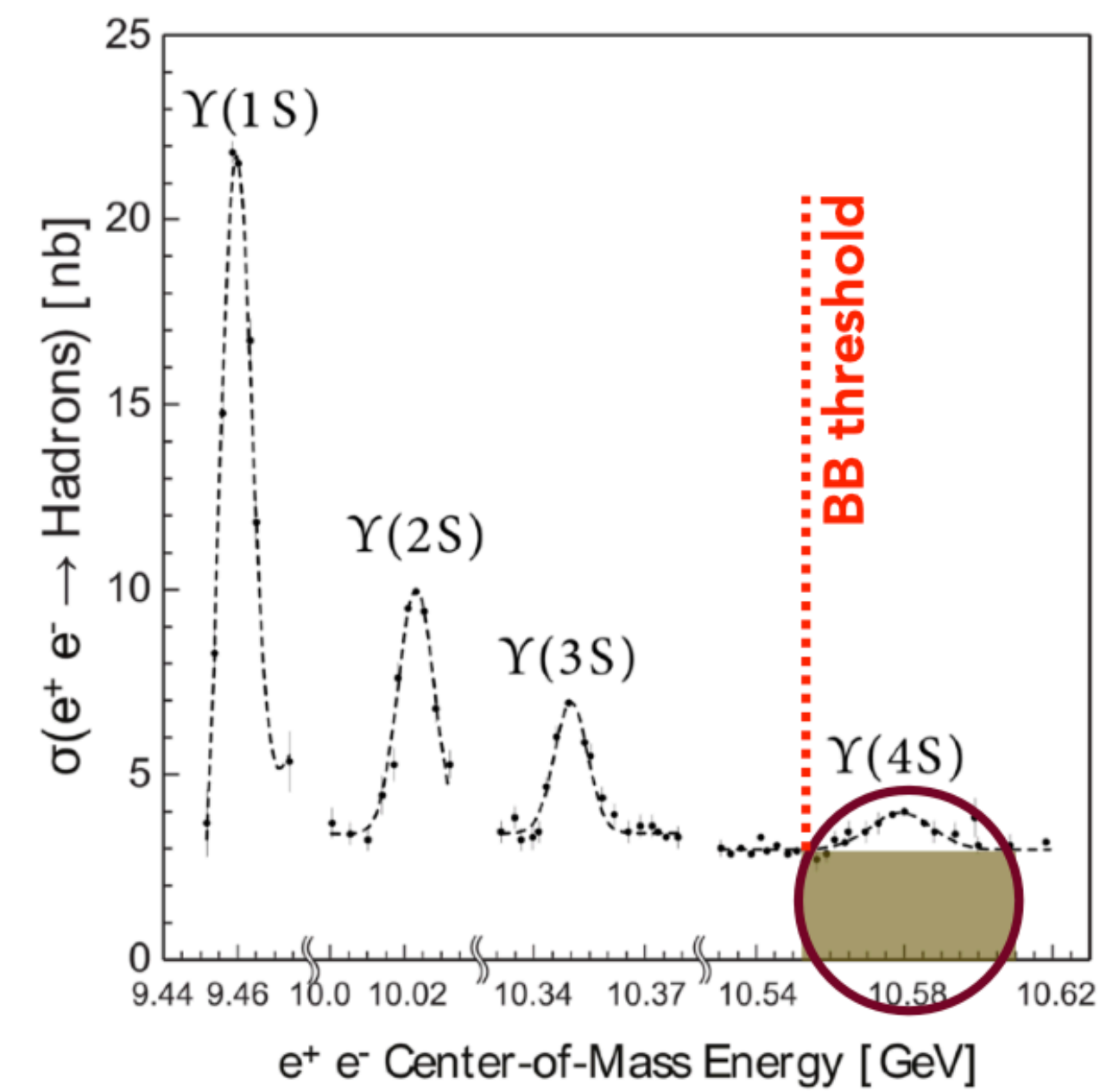
# Outline

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- SuperKEKB and Belle II experiment
- High Level Trigger (HLT) structure and data flow
- Limitations and first upgrade
- Further upgrade: Tracking optimization
- Far future: a tidier and faster HLT for the target luminosity

# B-Factory idea

- Asymmetric collider  $e^+e^-$ ,  $E_{cm} = m(\Upsilon(4S)) = 10.58 \text{ GeV}$   
 $\Rightarrow$  coherent  $B\bar{B}$  pairs
- Boost of center-of-mass ( $\beta\gamma = 0.28$ )  $\Rightarrow$  measure of  $\Delta z$
- High luminosity  $\Rightarrow$  precision measurements
- Hermetic detector, high precision in vertexing  $\Rightarrow$  closed kinematics



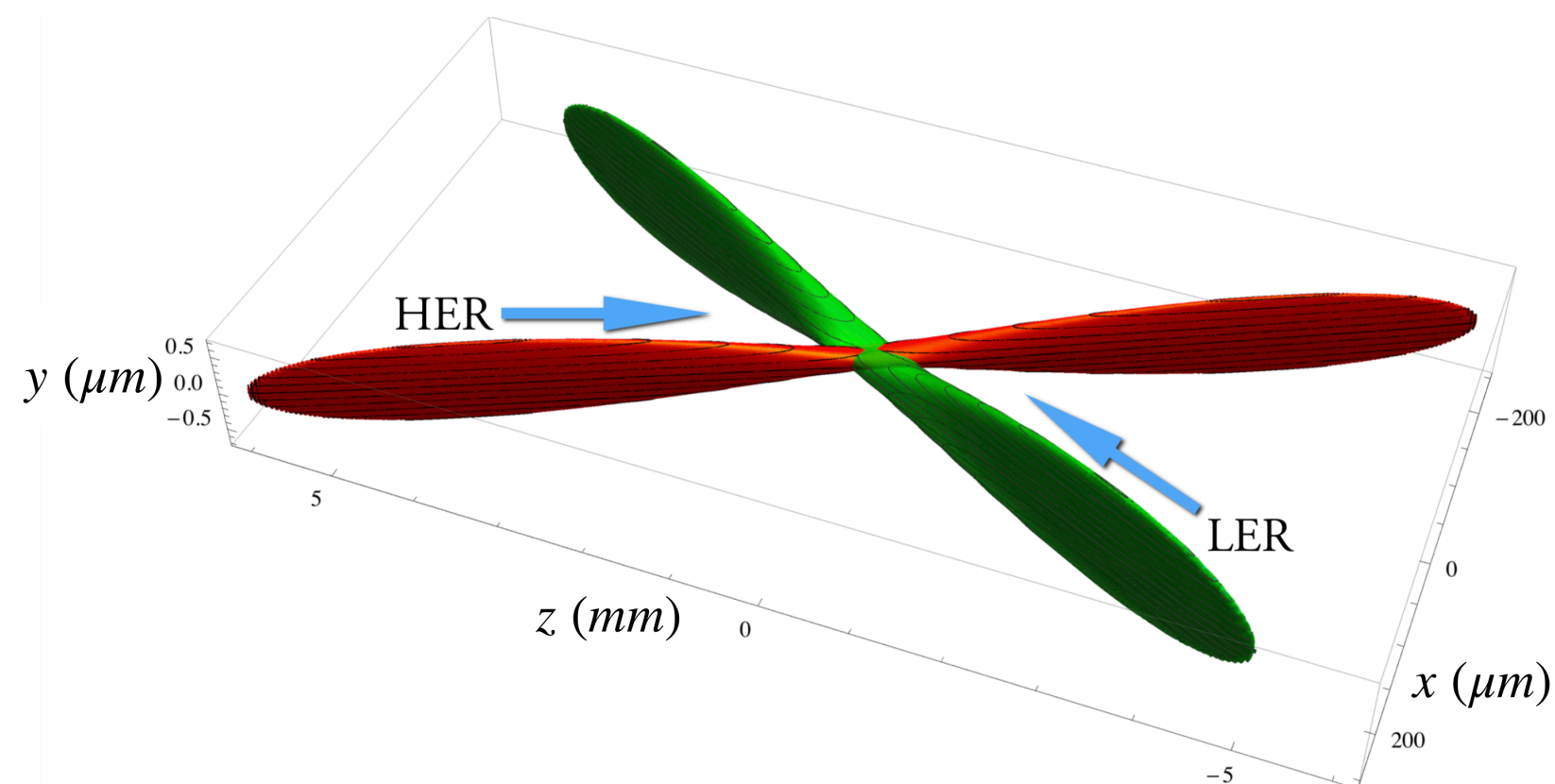
$e^+e^- \rightarrow$	Cross section [nb]
$\Upsilon(4S)$	$1.05 \pm 0.10$
$c\bar{c}$	1.30
$s\bar{s}$	0.38
$u\bar{u}$	1.61
$d\bar{d}$	0.40
$\tau^+\tau^-(\gamma)$	0.919
$\mu^+\mu^-(\gamma)$	1.148
$e^+e^-(\gamma)$	$300 \pm 3$



# Belle II experiment at SuperKEKB collider

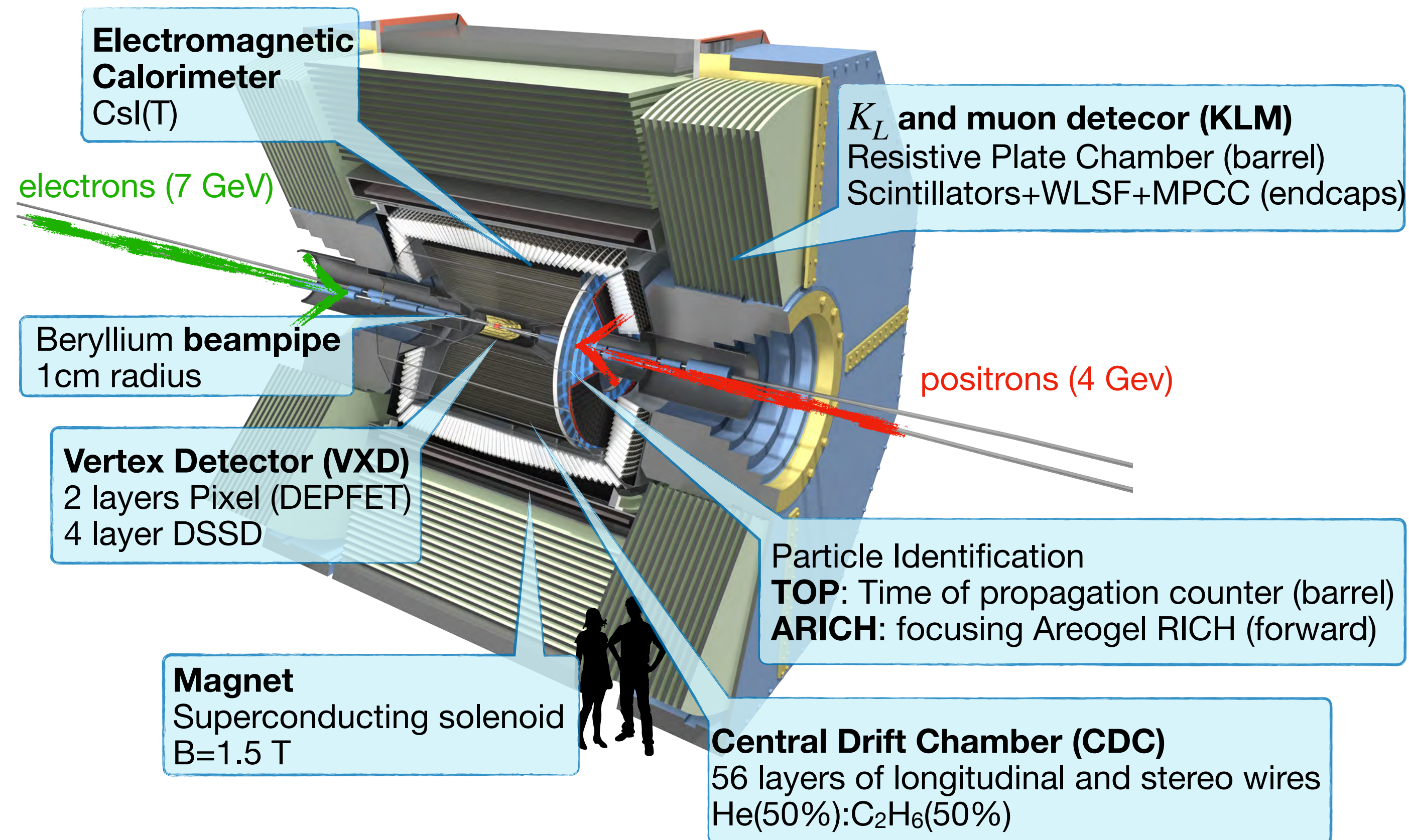
## SuperKEKB

- Successor of KEKB (1999-2010, KEK, Japan)
- Target peak luminosity:  
 $6 \cdot 10^{35} \text{ cm}^{-2}\text{s}^{-1}$  (x 30 of KEKB)
- Target integrated luminosity:  
 $50 \text{ ab}^{-1}$  (x 70 Belle at  $\Upsilon(4S)$ )



Nano-beam scheme:  
 $250 \mu\text{m}$  (Z)  $\times$   $10 \mu\text{m}$  (X)  $\times$   $50 \text{ nm}$  (Y)

## Belle II



[Belle II Technical Design Report, arXiv:1011.0352]

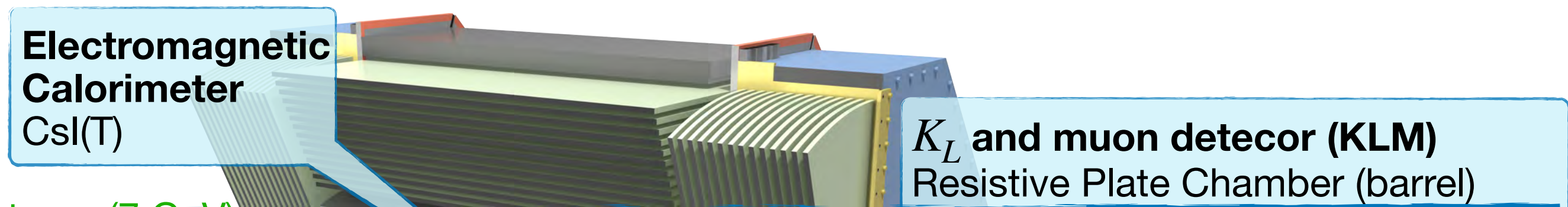


# Belle II experiment at SuperKEKB collider

## SuperKEKB

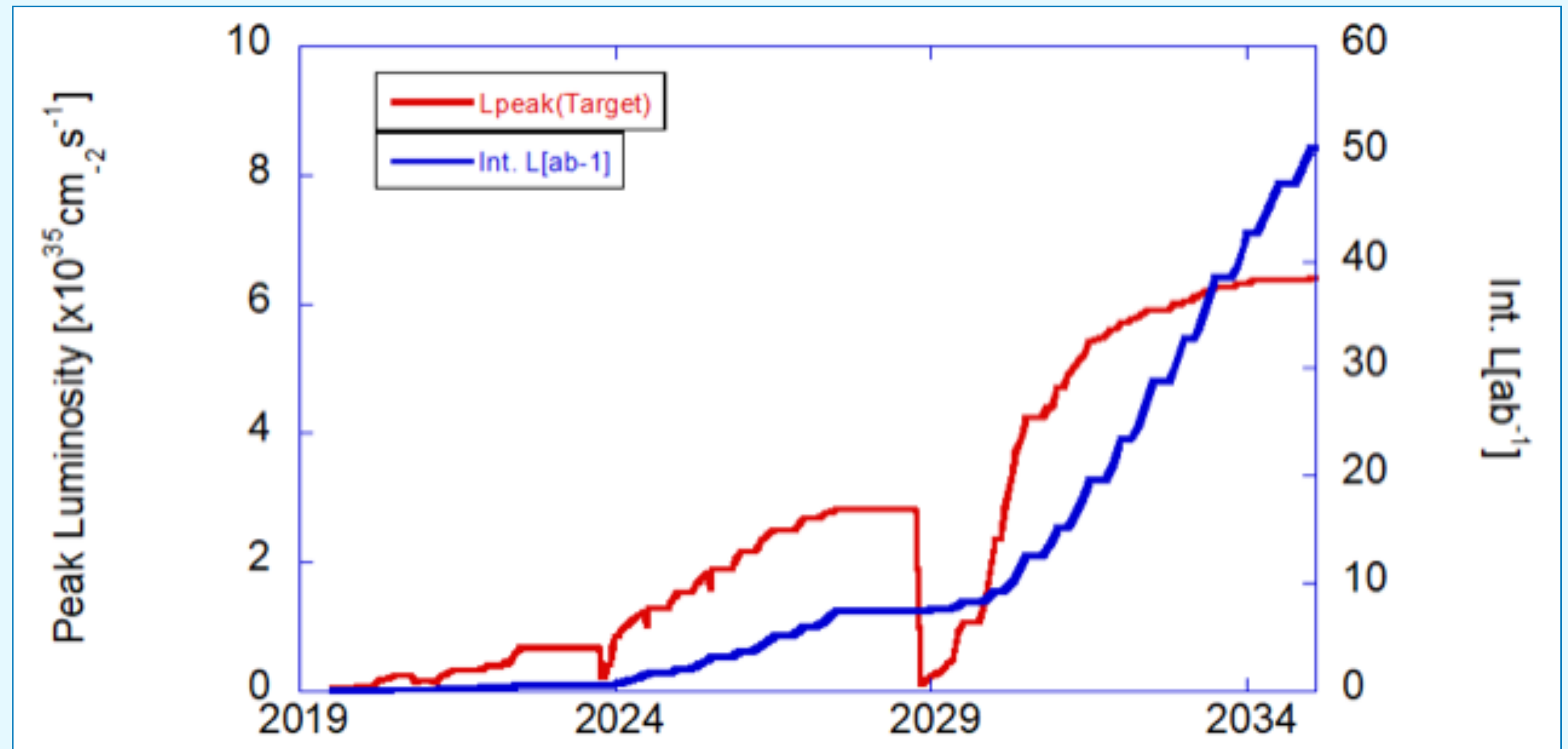
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## Belle II



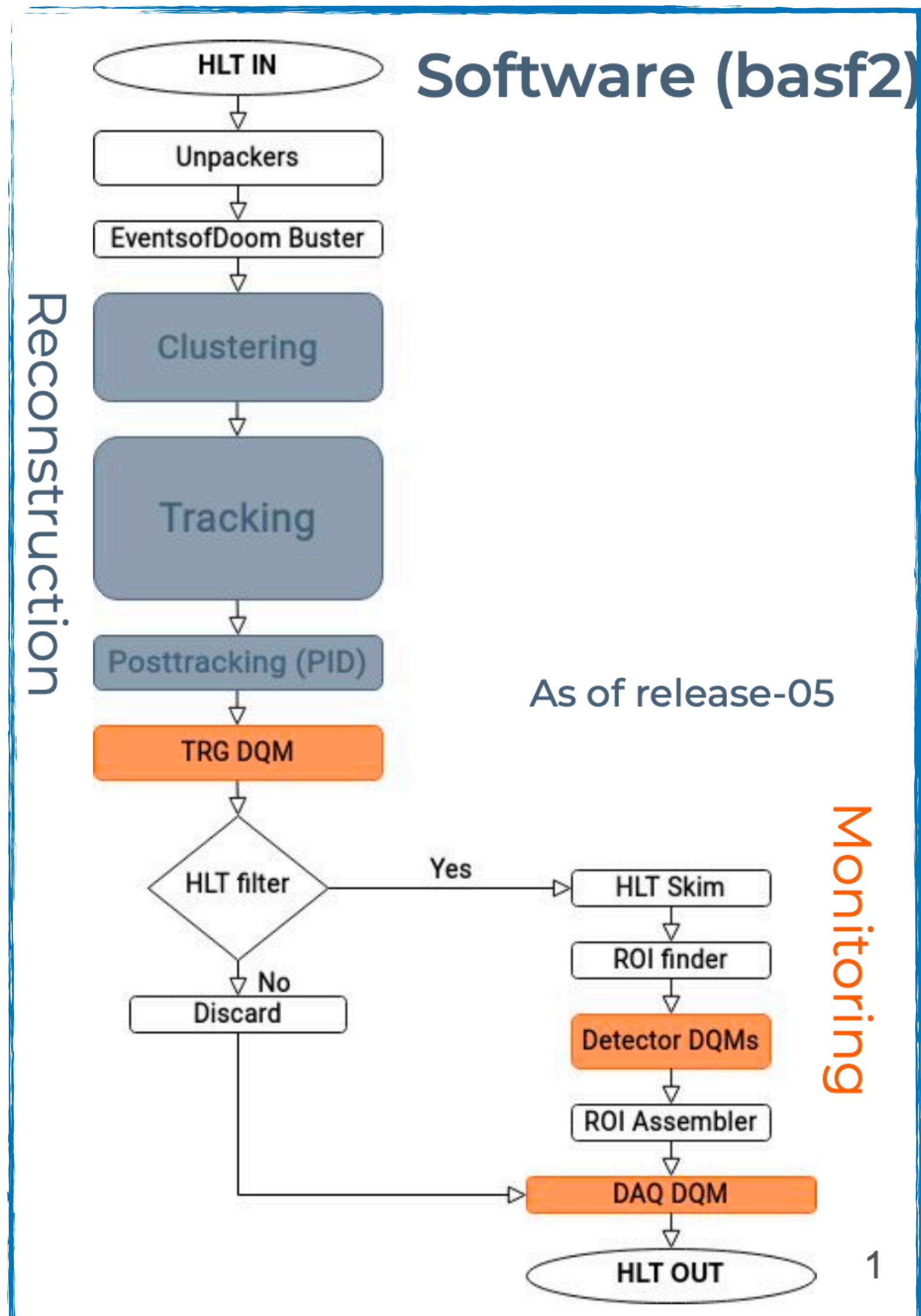
## Current Status

- complete detector data taking started in 2019
- Current peak luminosity  $4.7 \cdot 10^{34} \text{ cm}^{-2}\text{s}^{-1}$  (reached the 22/06/2022)
- current integrated luminosity:  $\sim 424 \text{ fb}^{-1}$  ( $\sim$ Babar $\sim$ 0.5 Belle)
- Long Shutdown 1 (LS1) started in July for several upgrades (beam pipe, pixel, TOP PMT)





# HLT software



[by Vidya Vobbilisetti]


# SVD Time

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- How  
average of cluster time of all cluster associated to tracks in the event
- When  
estimation performed after clustering, within SVD track finding
- Performance  
efficiency=99.8% (higher than CDC)  
resolution=1ns (as CDC)  
Time consumption=0.015 ms/event (2000 times better than CDC)

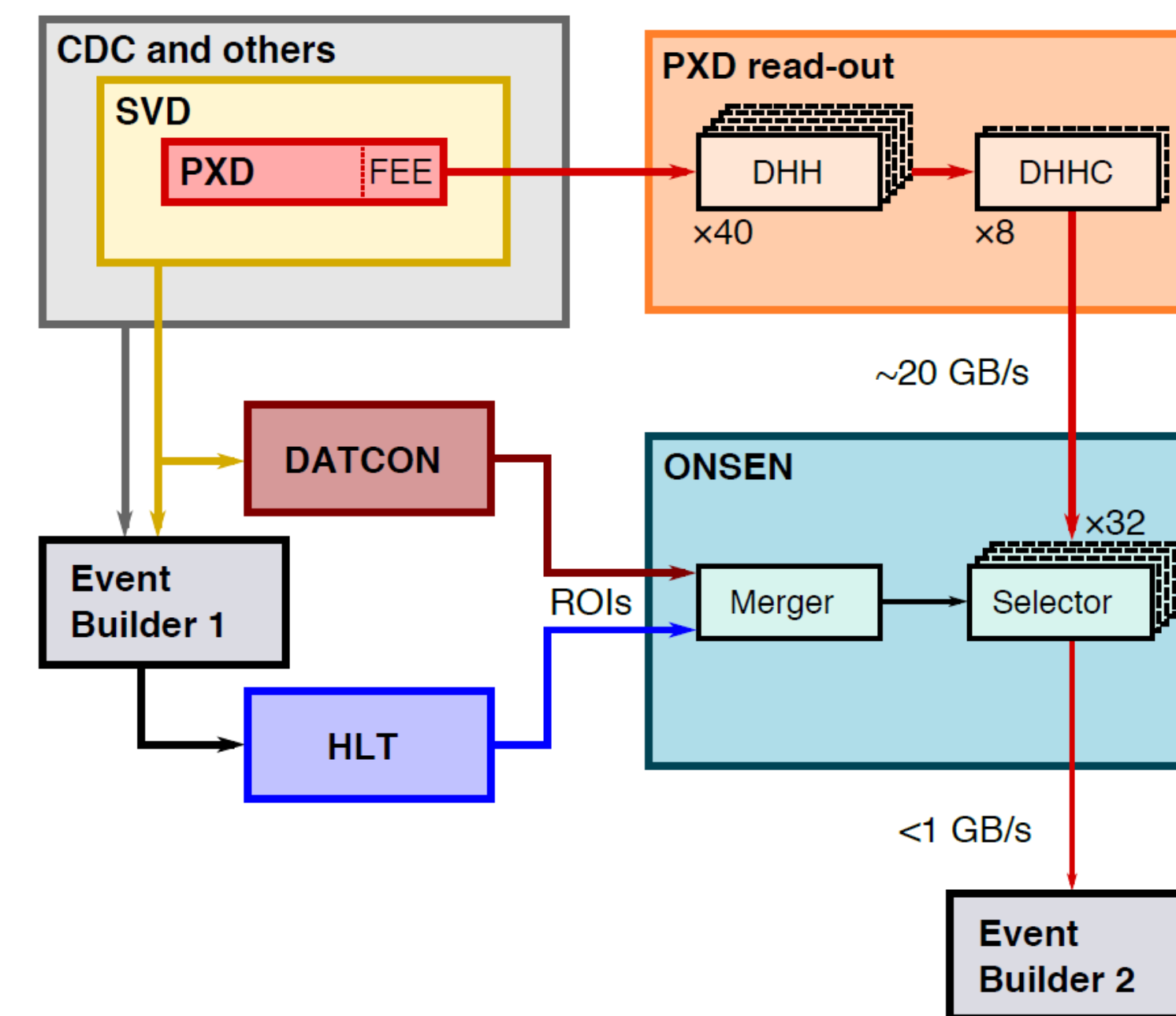


# PXD and ROI

- Redout time of all PXD sensors:  $20 \mu\text{s} \Rightarrow$  too slow for L1
  - full PXD output rate: 20 GB/s (with zero-suppression applied)  $\Rightarrow$  too big for the bandwidth
- 
- PXD saved on the ONSEN: FPGA system to collect and temporary store PXD data
  - HLT takes the decision and cut events in the ONSEN: **x3 data reduction**
  - HLT evaluates ROIs (Region Of Interest) on the PXD layers, using CDC+SVD tracks: **x10 data reduction**
  - Event builder 2 merging HLT and PXD data

## L1 trigger numbers

- input rate: 250 MHz (4ns)
- latency: few  $\mu\text{s}$
- Output rate: 10-30 kHz



# Demonstrative optimization

**Disclaimer:** simply a good setup after few days of tests, not really optimized!

**Adopted criteria:** obtain reasonable **convergence behaviour** (use the iteration range, use mainly primary convergence criterion, exploit more wisely the  $p$ -value), with the CPU **time figure of merit**

Parameter	BASELINE VALUE	NEW VALUE
$\Delta w$	0.001	0.1
$\Delta p$	1	0.001
Prob cut	0.001	0.001
Max failed hits	5	5
(Tmax, Tmin, Niter)	(100, 0.1, 5)	(2, 0.01, 5)
Min Iterations	Niter (5)	1
Min iteration for pval check	MinIter (5)	MinIter (1)
Max iterations	Niter+4 (9)	Niter+4 (9)

## Optimization approach:

- increase  $\Delta w$  threshold  $\Rightarrow$  **allow convergence**
- decrease  $\Delta p$  threshold  $\Rightarrow$  **avoid automatic convergence**
- Change min-max iterations  $\Rightarrow$  **reduce average number of iterations**
- Change annealing scheme (lowering initial  $T$ )  $\Rightarrow$  **avoid discarding weights**  $\Rightarrow$  "speed-up" the convergence

## Convergence behaviour after optimization:

- Convergence spread between iteration 2 and 6 (peak at 4)
- convergence by pval about 10% of the time



# DAF general features

- For each call of the fitter the DAF (*Deterministic Annealing Filter*) is called
- The purpose of the DAF is to remove from the fit the **outlier hits** to improve the fit accuracy
  - removing of beam bkg hits
  - removing of hits from other tracks
  - removing of  $\delta$ -rays
  - removing/fix of wrong L/R CDC hit assignment
- The DAF is **assigning weights** (in the range  $[0,1]$ ) to each hit, accordingly to the residuals between the measurement and the Kalman Filter prediction.
- The fit is **repeated multiples times lowering a temperature** parameter  $T$ 
  - high  $T$  --> softer assignment , weights tend to move to 0.5
  - low  $T$  --> harder assignment, weights tend to be 1 or 0
- A **convergence criterion** is defined, based on the variation of the weights and the p-value of the fit (see next slide)

# DAF convergence criterion

1. if  $\max_{i \in \text{track}} (|w_{j-1} - w_j|) < \Delta w = 10^{-3}$ , where  $i$ =hits,  $j$ =iterations
2. if  $j > N_{\min} = 5$  and  $|p_{j-1} - p_j| < \Delta p = 1$ , where  $p$ =p-value of the fit
3. if  $j > N_{\max} = 9$

Additional parameters which regulate convergence:

- The **annealing temperature** is lowered from  $T_{\max} = 100$  to  $T_{\min} = 0.1$  in  $N_{\min}$  steps ( $T$  is constant in the iterations  $[N_{\min}, N_{\max}]$ )
- a probability cut  $P = 10^{-3}$  regulate a damping factor of the weights, to force them to be 0 if their value is below a threshold.



# DAF behaviour

- The criterion 1 (weights) is never satisfied
- The criterion 2 is immediately satisfied as soon as checked
- The **DAF always\* run 5 iterations**
- \* = sometimes (<0.1%) the pvalue==0, in that case additional iterations are run

1.  $\max_{i \in \text{track}} (|w_{j-1} - w_j|) < \Delta w = 10^{-3}$
2.  $j > N_{\min} = 5$  and  $|p_{j-1} - p_j| < \Delta p = 1$
3.  $j > N_{\max} = 9$



**There are room for optimize the DAF iterations!**

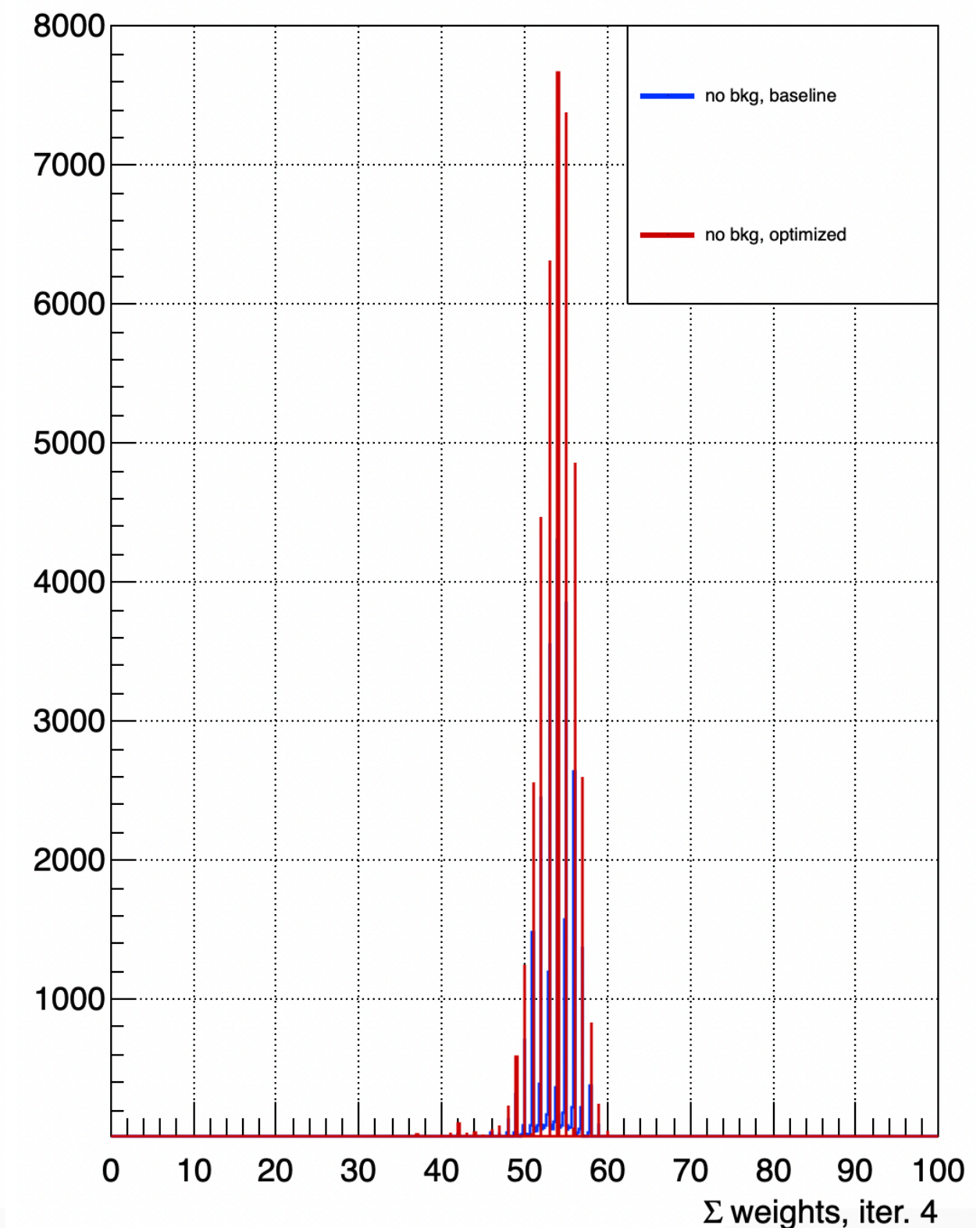
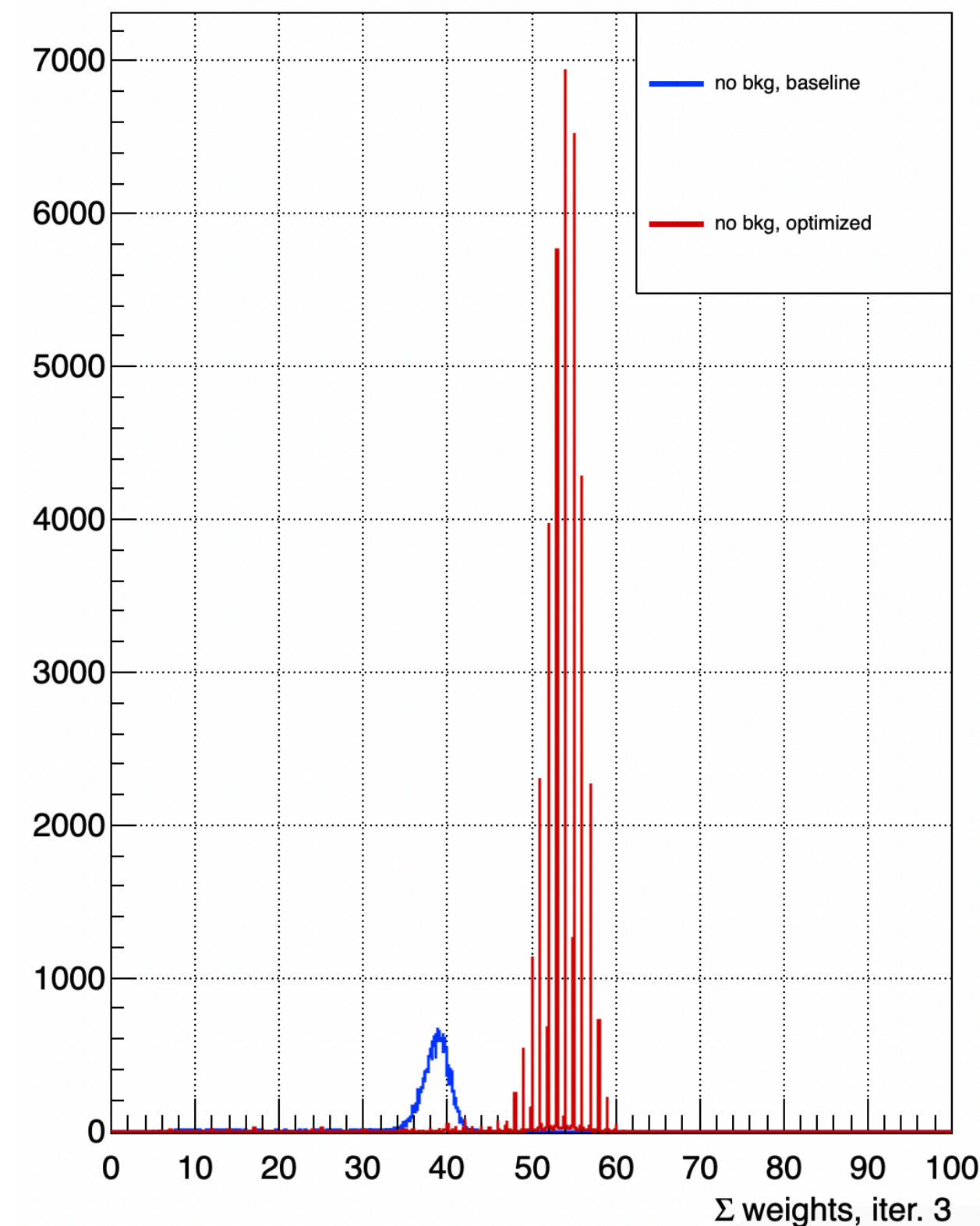
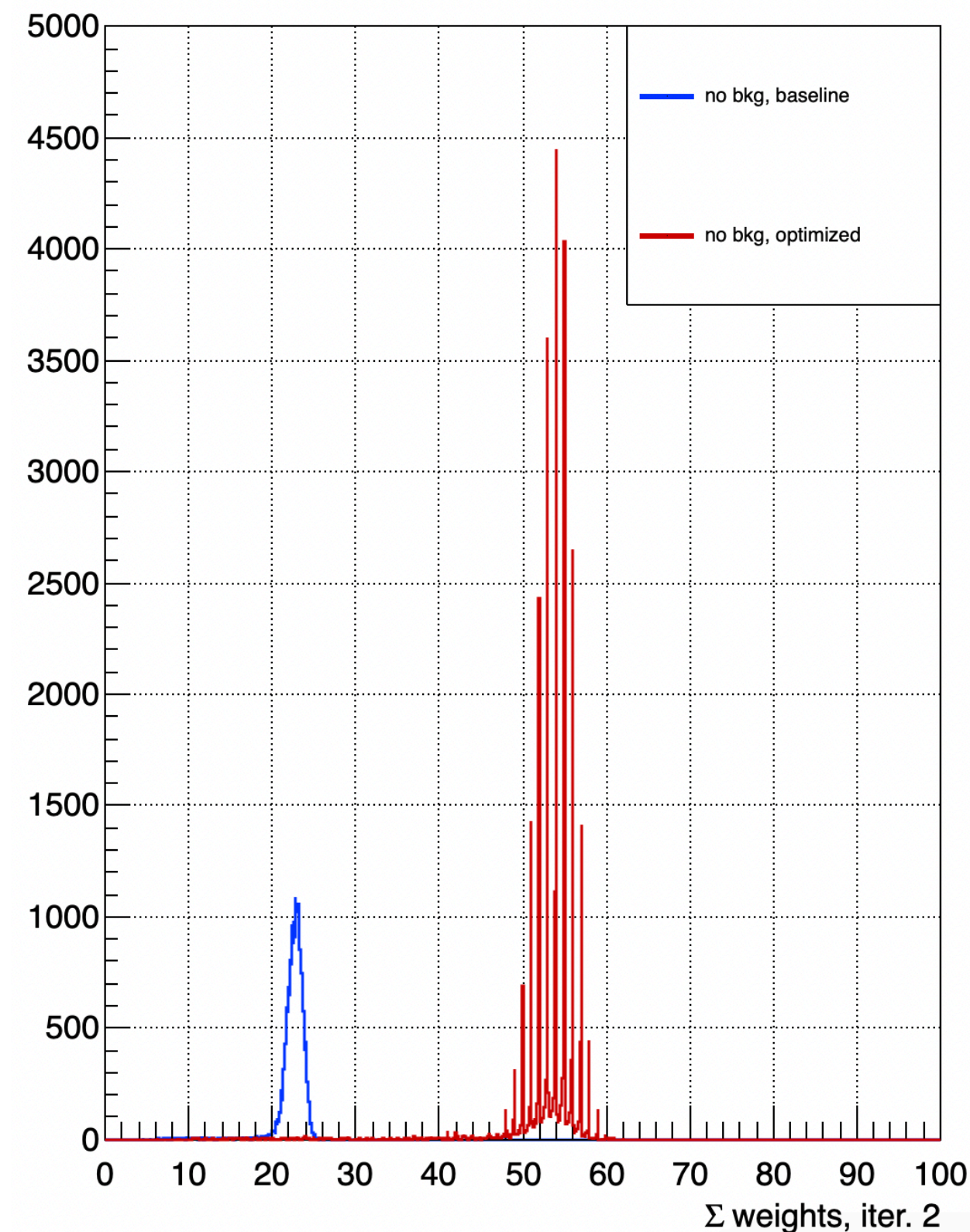
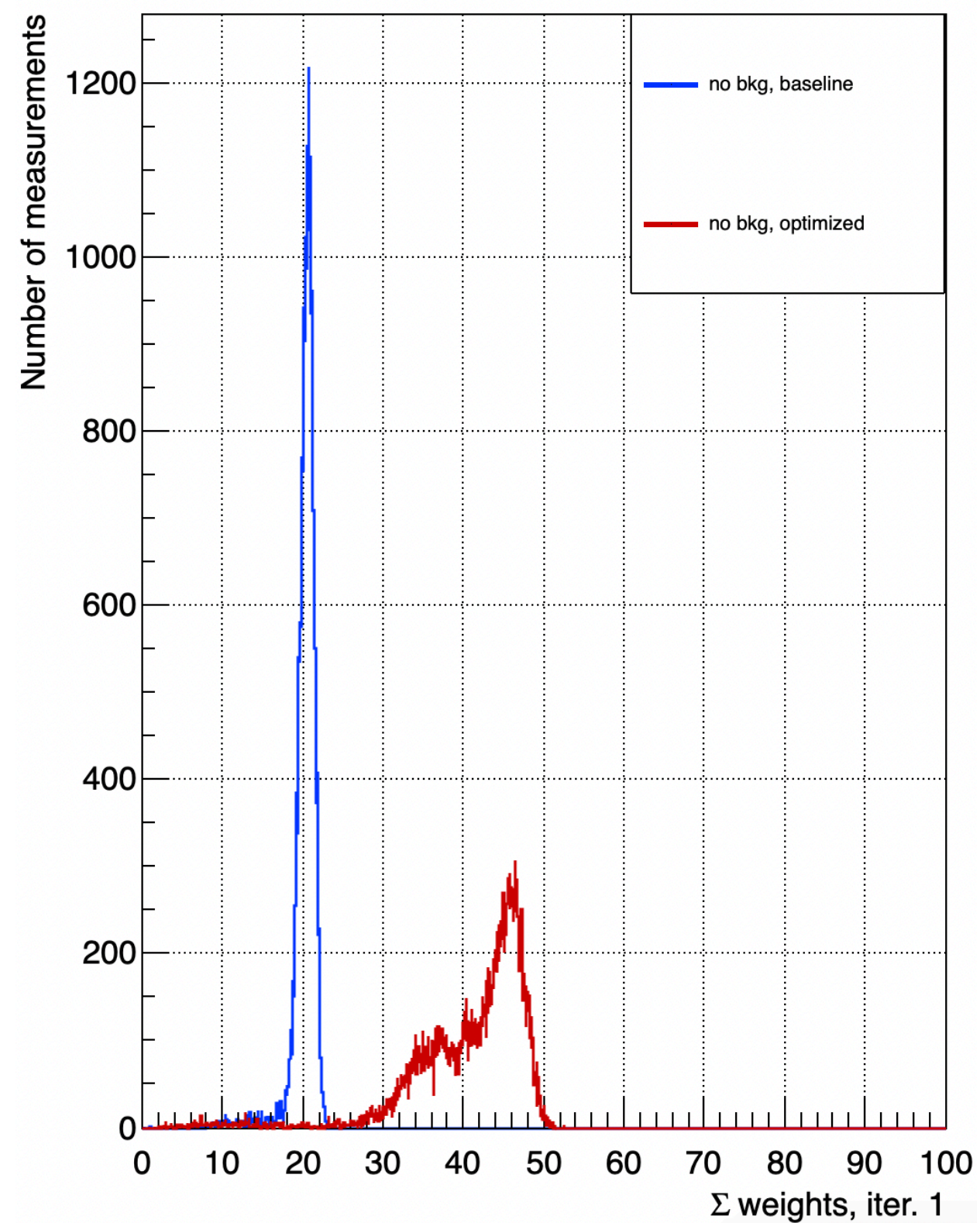
- NB: the **CPU time is ~proportional** to number of iterations of the DAF
- Some examples (single mass hypothesis):
  - $N_{\min} = 2$ : 6.5 ms (7.7 ms) w/o SVD (with SVD)
  - $N_{\min} = 5$ : 10.4 ms (15.5 ms) w/o SVD (with SVD)



# DAF convergence visualization

Test condition:

- CDC only tracking
- Muon Gun
- $p_T=1$  GeV
- $\theta = 70^\circ$



The Faster convergence is visible from the weight evolution

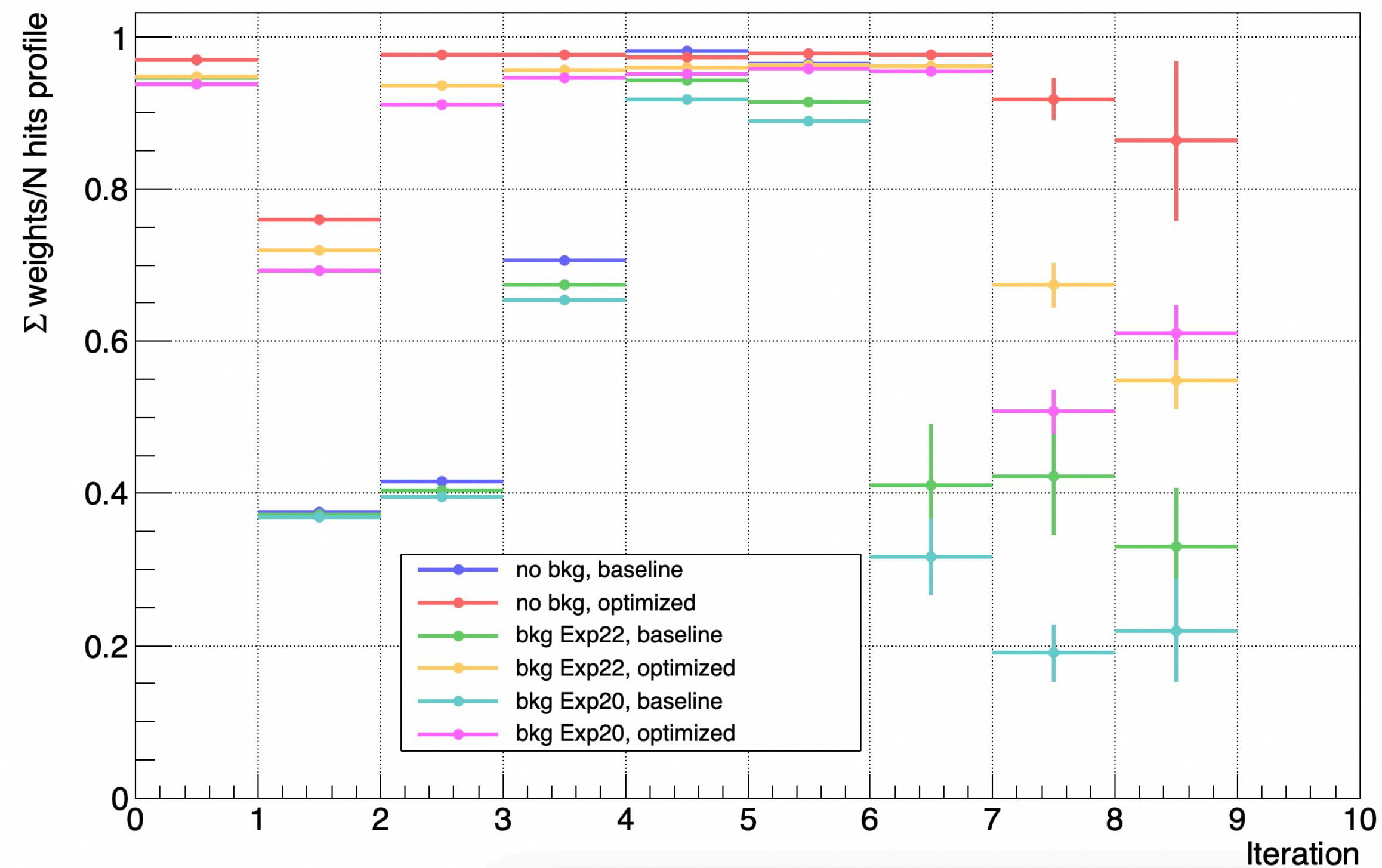


# Optimization performance (DAF 1/4)

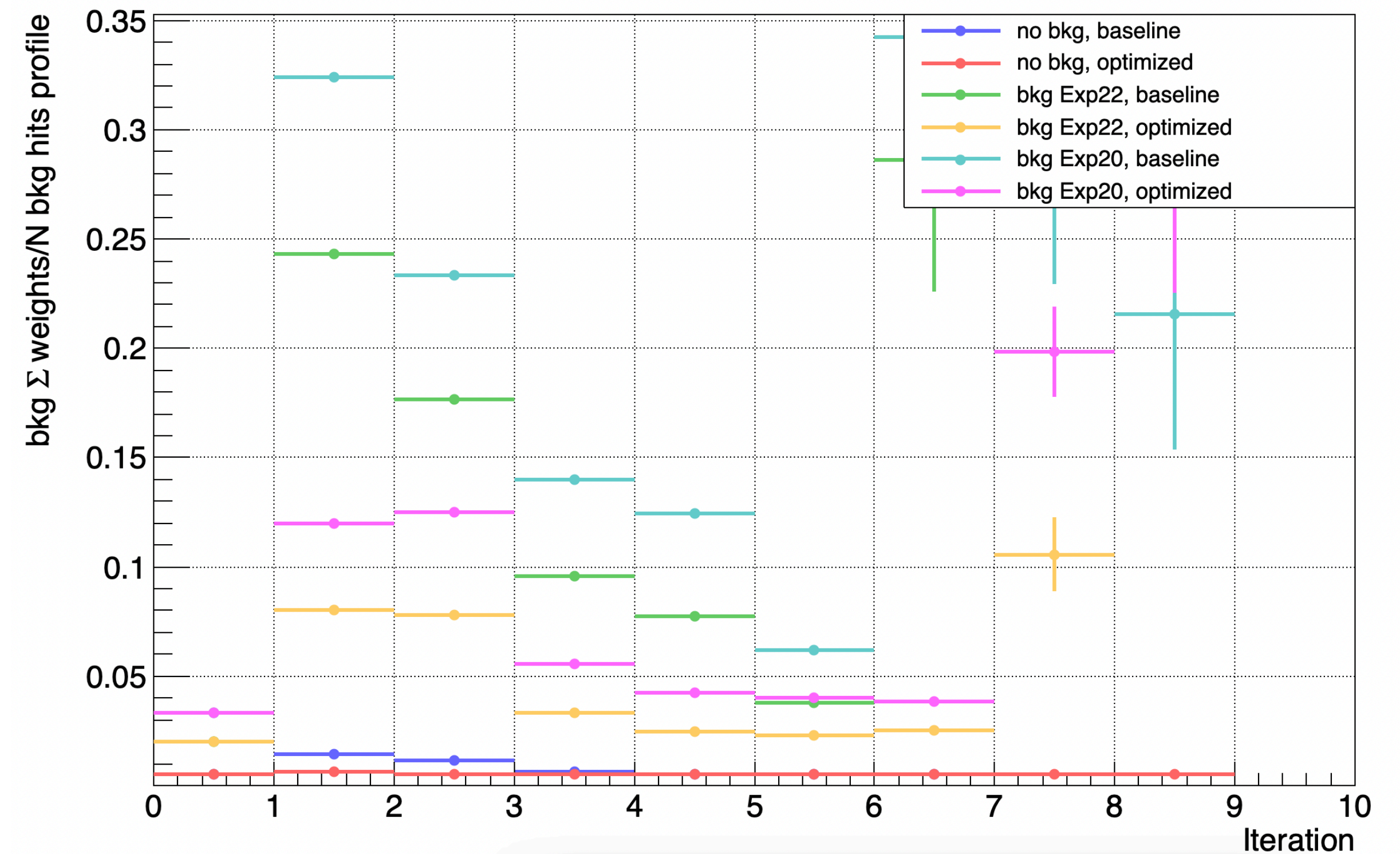
Test condition:

- CDC only tracking
- Muon Gun
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## hits efficiency profile



## bkg hits efficiency profile



At the end of the day, about the same bkg rejection performance

Clear (good) effect of reduced Temperature

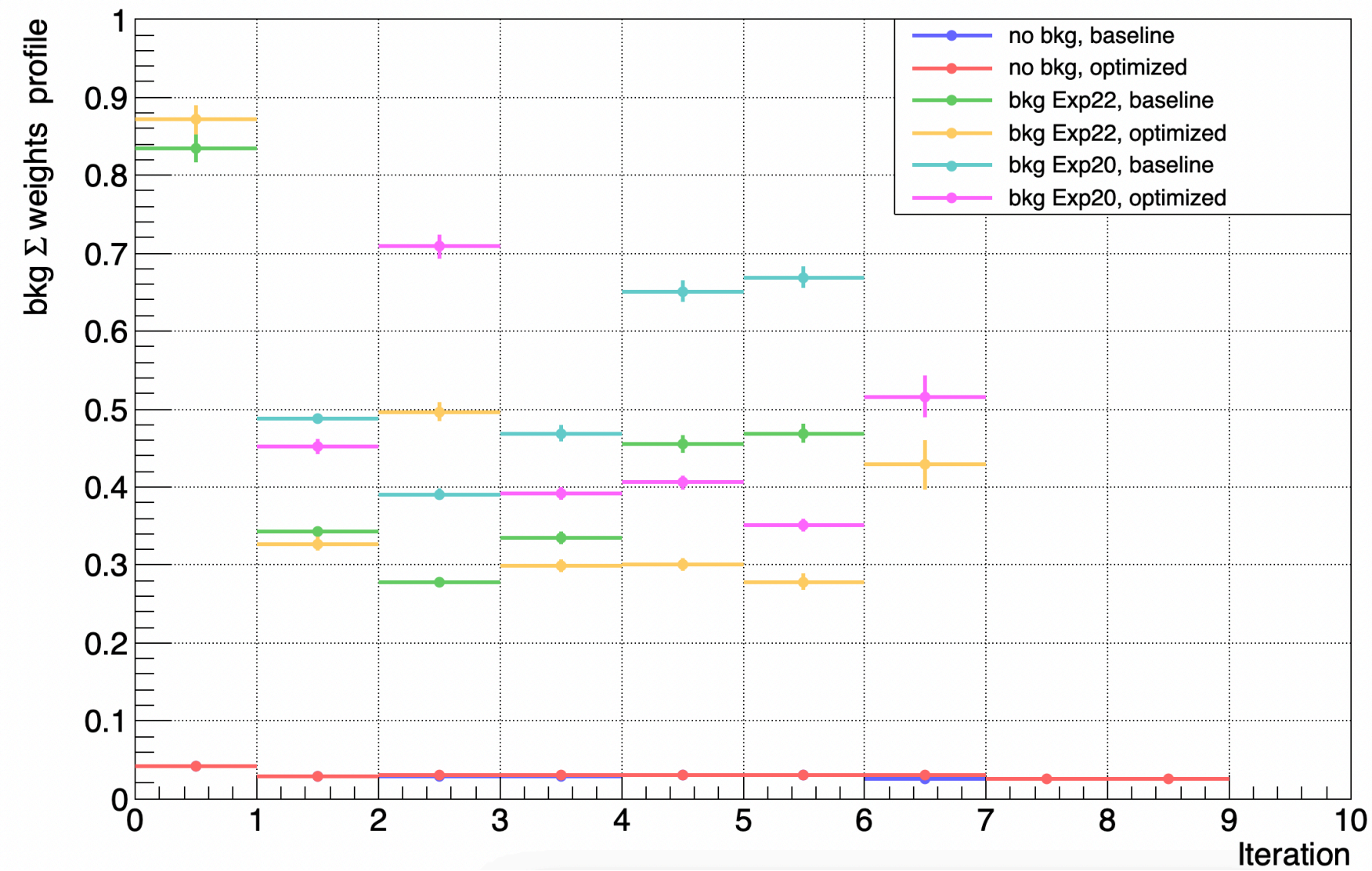


# Optimization performance (DAF 2/4)

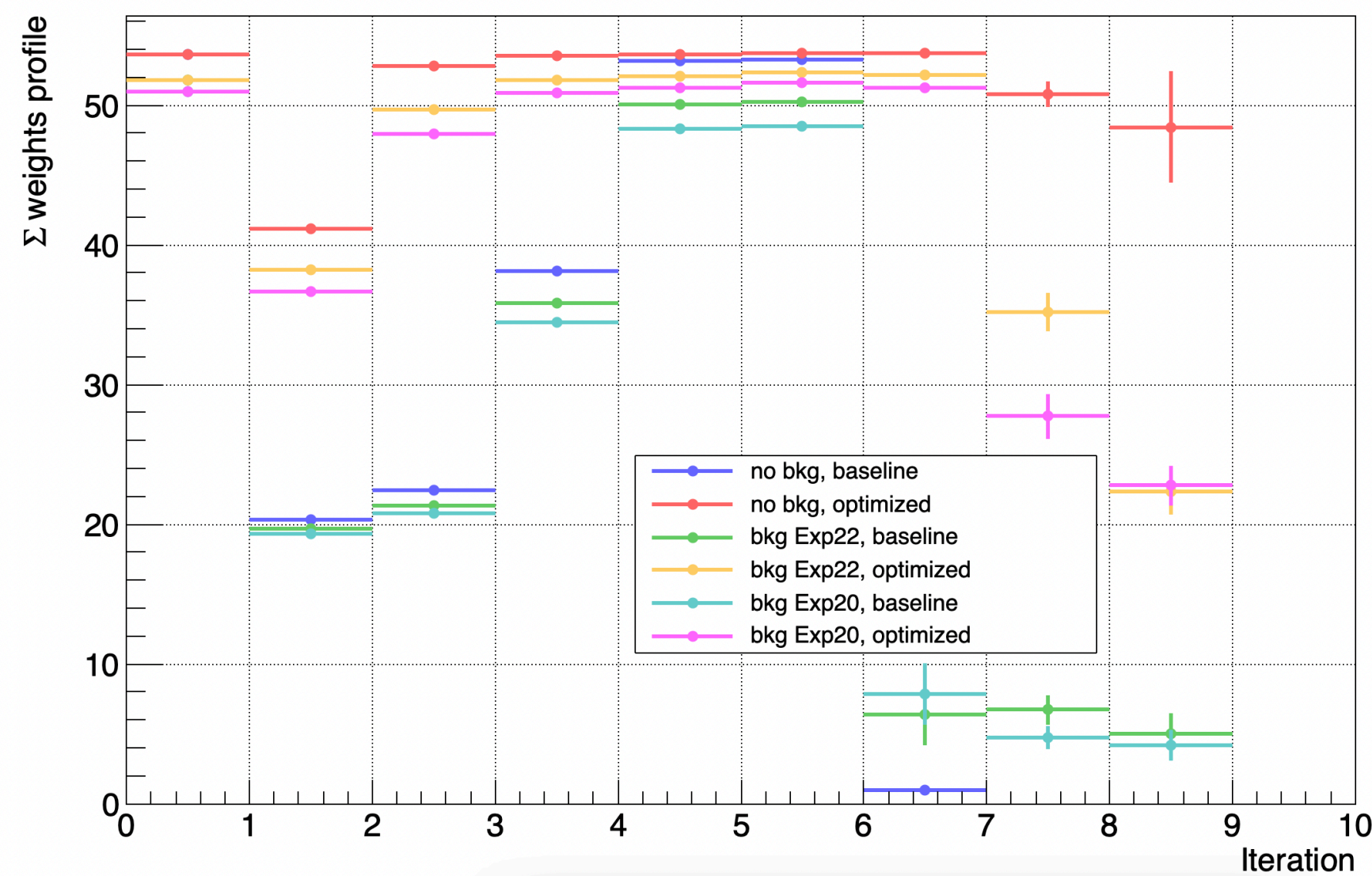
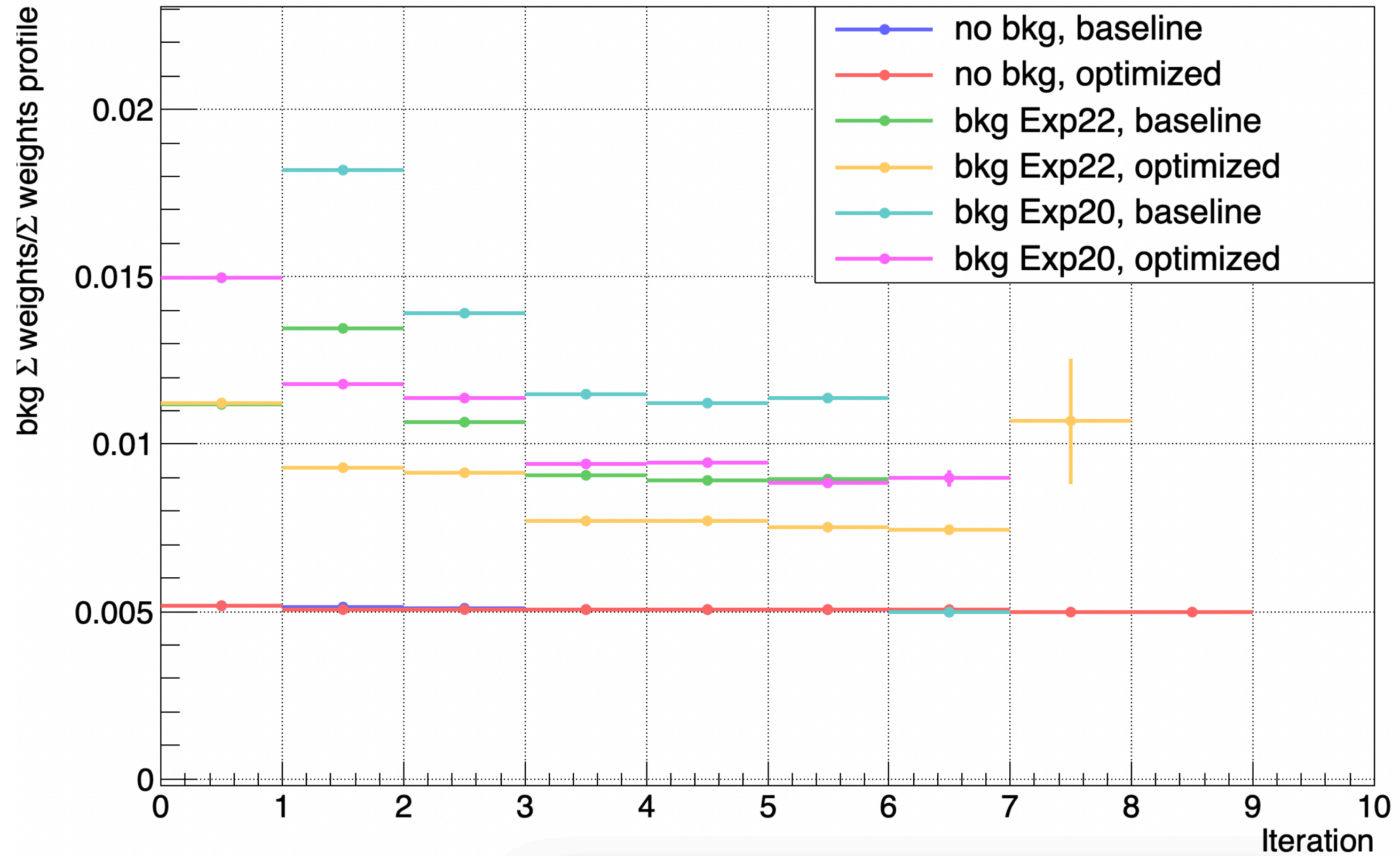
Test condition:

- CDC only tracking
- Muon Gun
- $p_T=1$  GeV
- $\theta = 70^\circ$

un-purity



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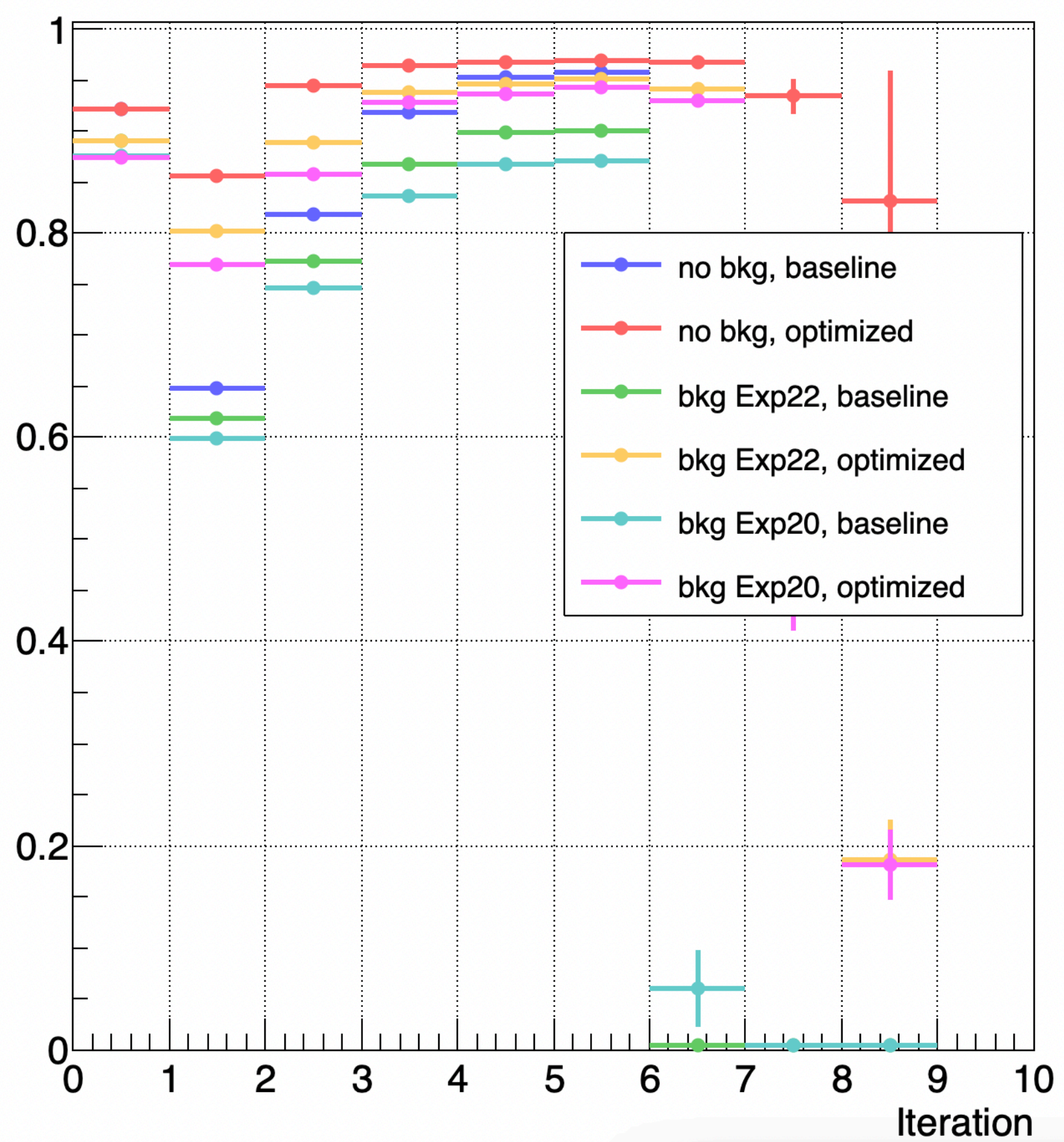
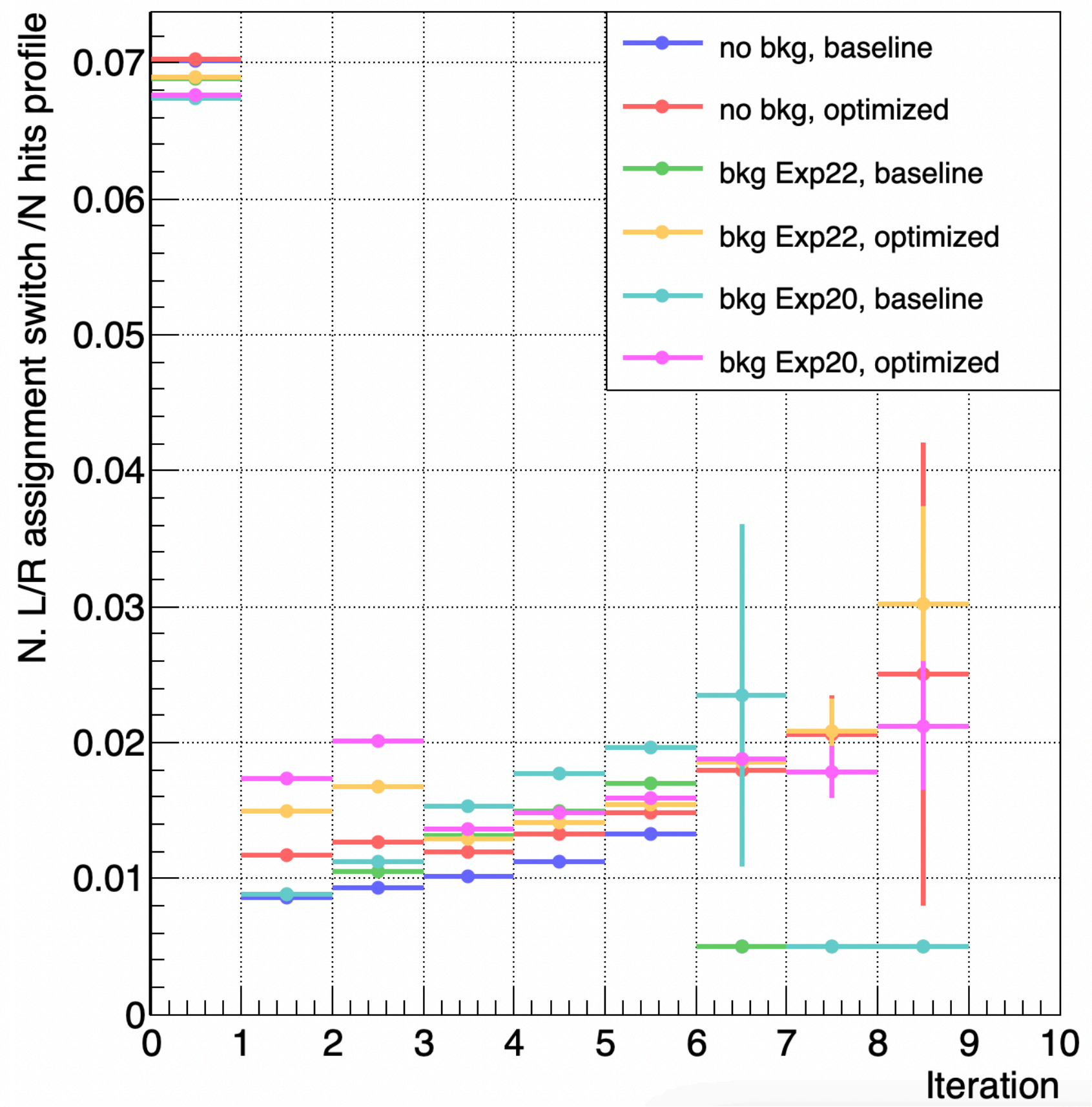
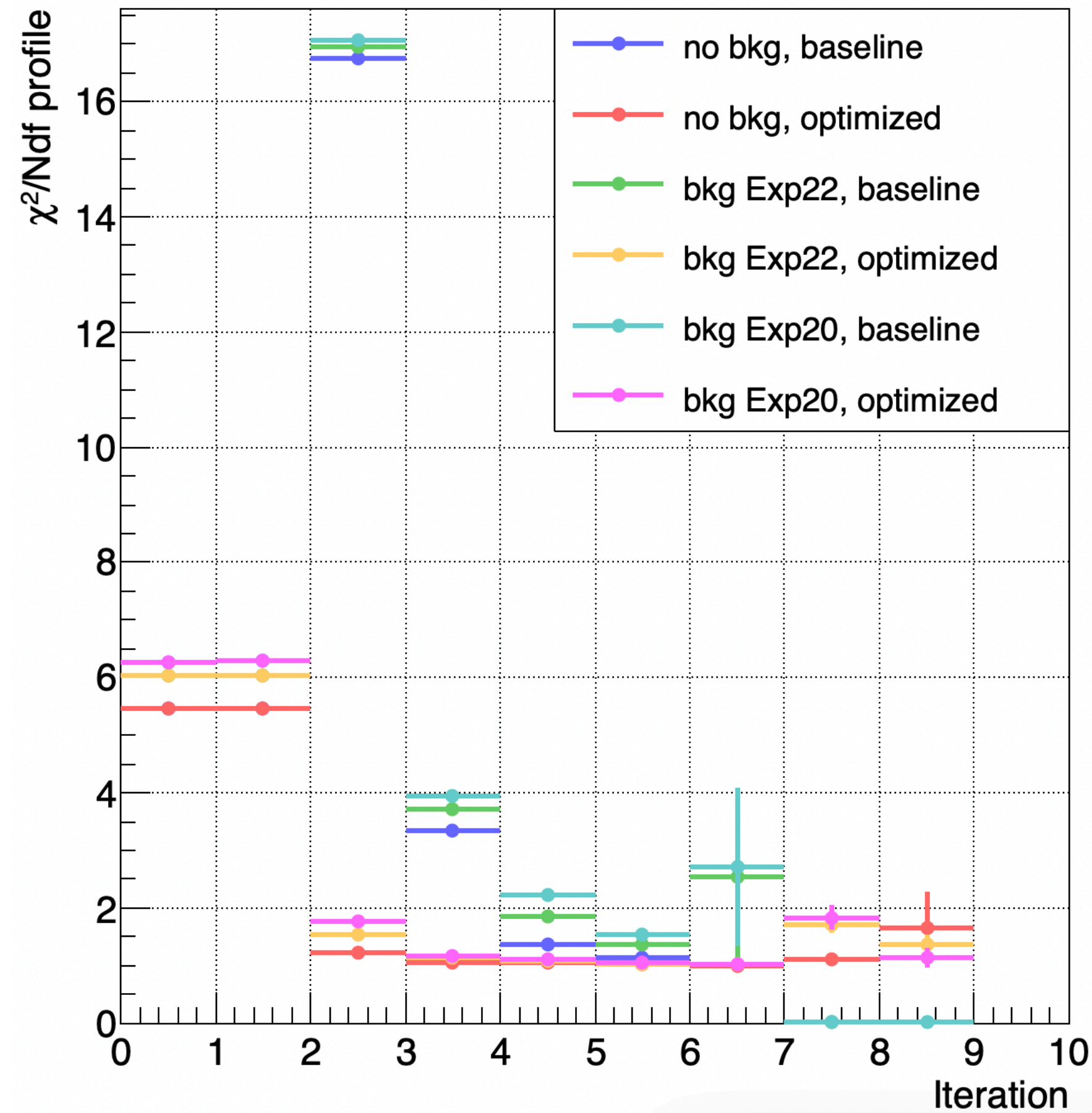




# Optimization performance (DAF 3/4)

Test condition:

- CDC only tracking
- Muon Gun
- pT=1 GeV
- $\theta = 70^\circ$

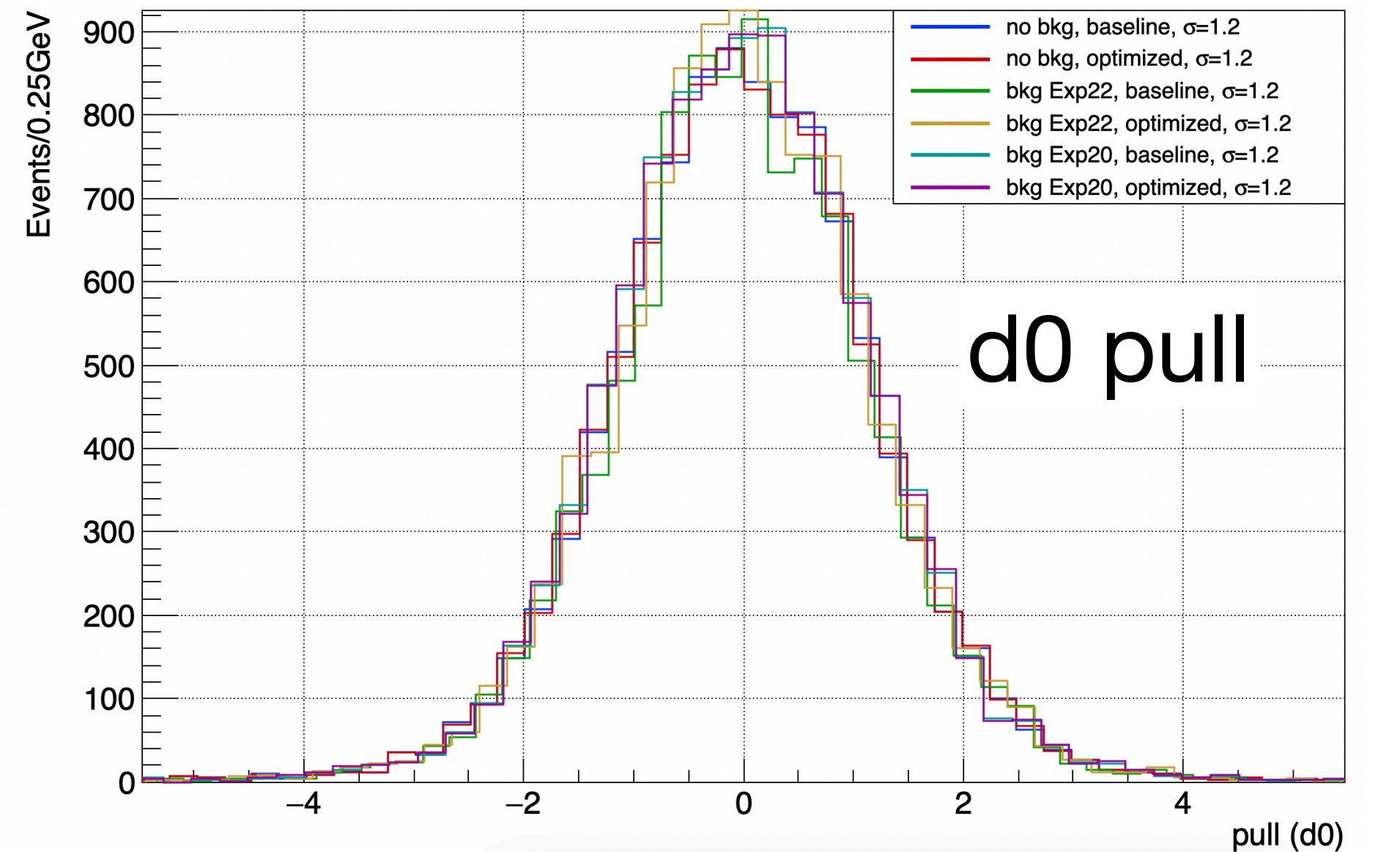
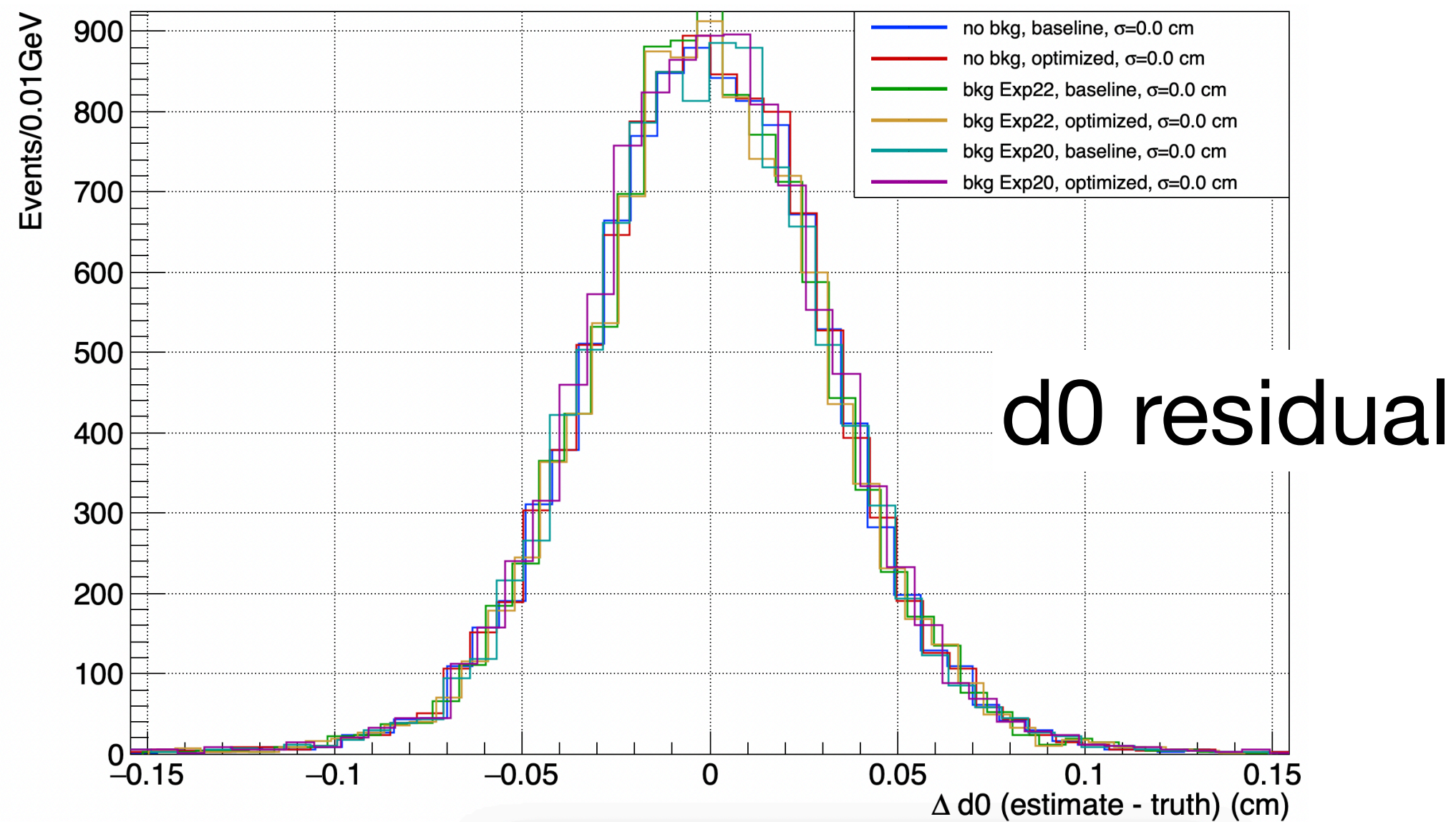
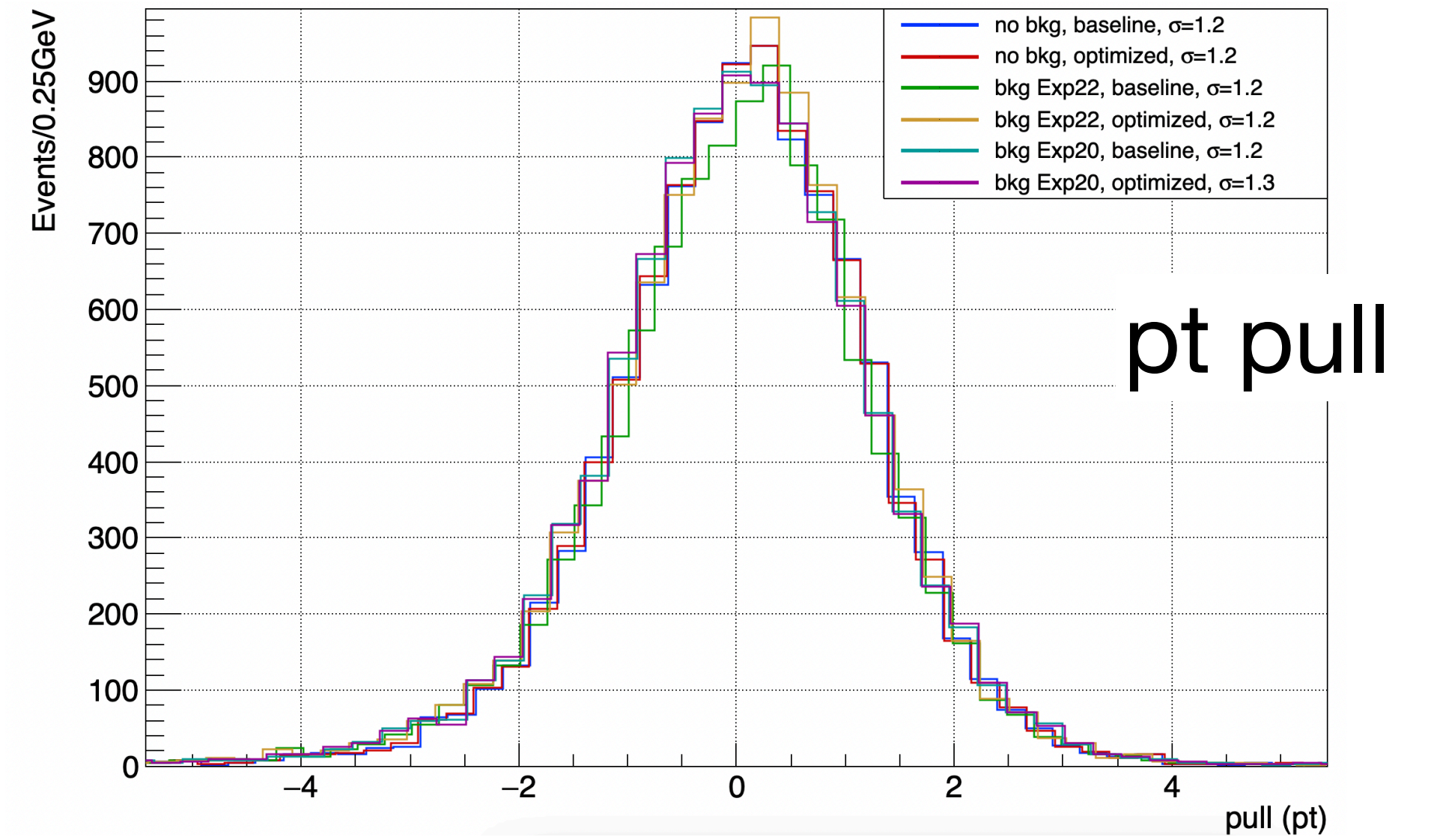
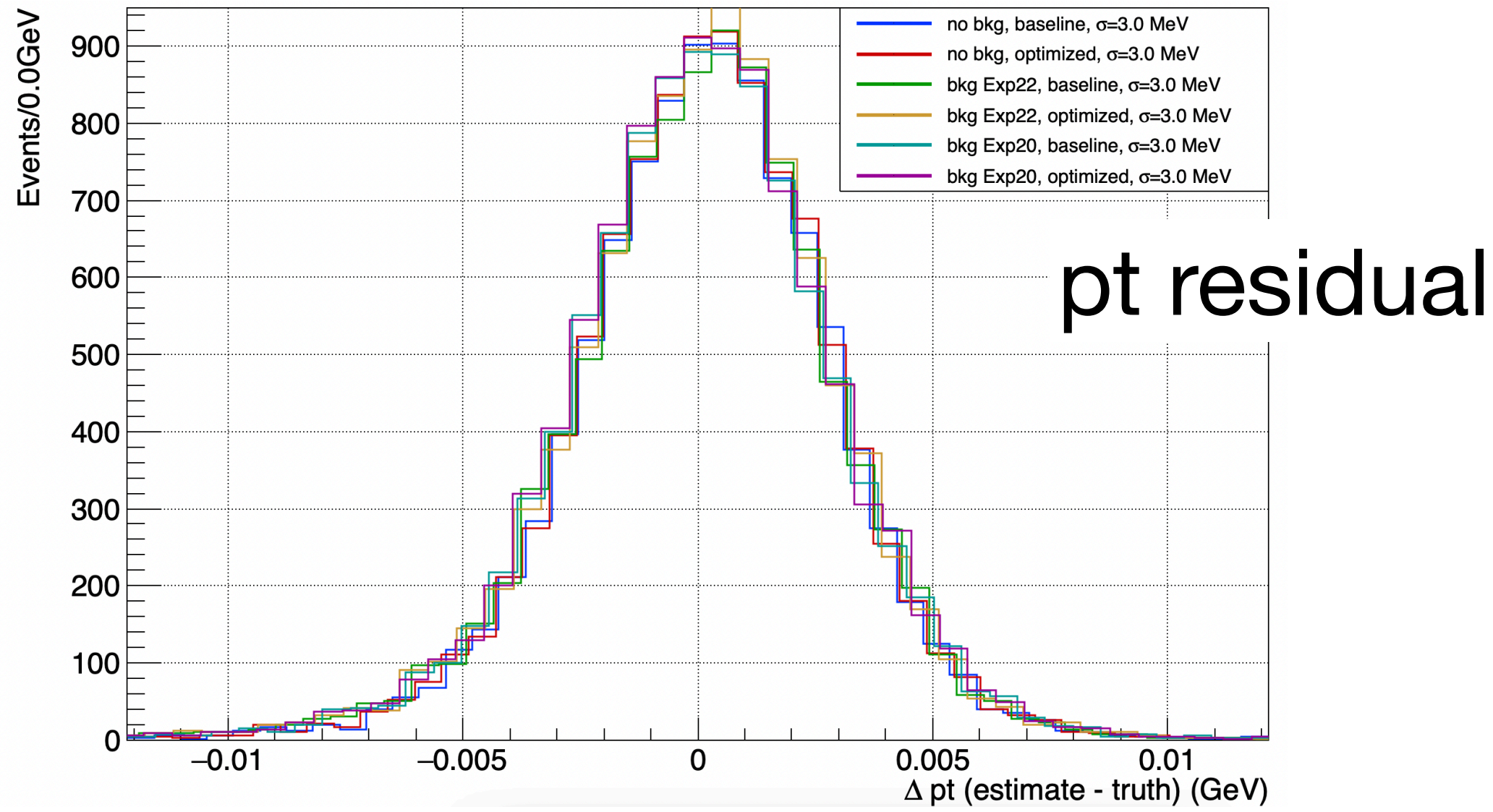


At the end of the day, about the same L/R performance



# Optimization performance (tracking 1/2)

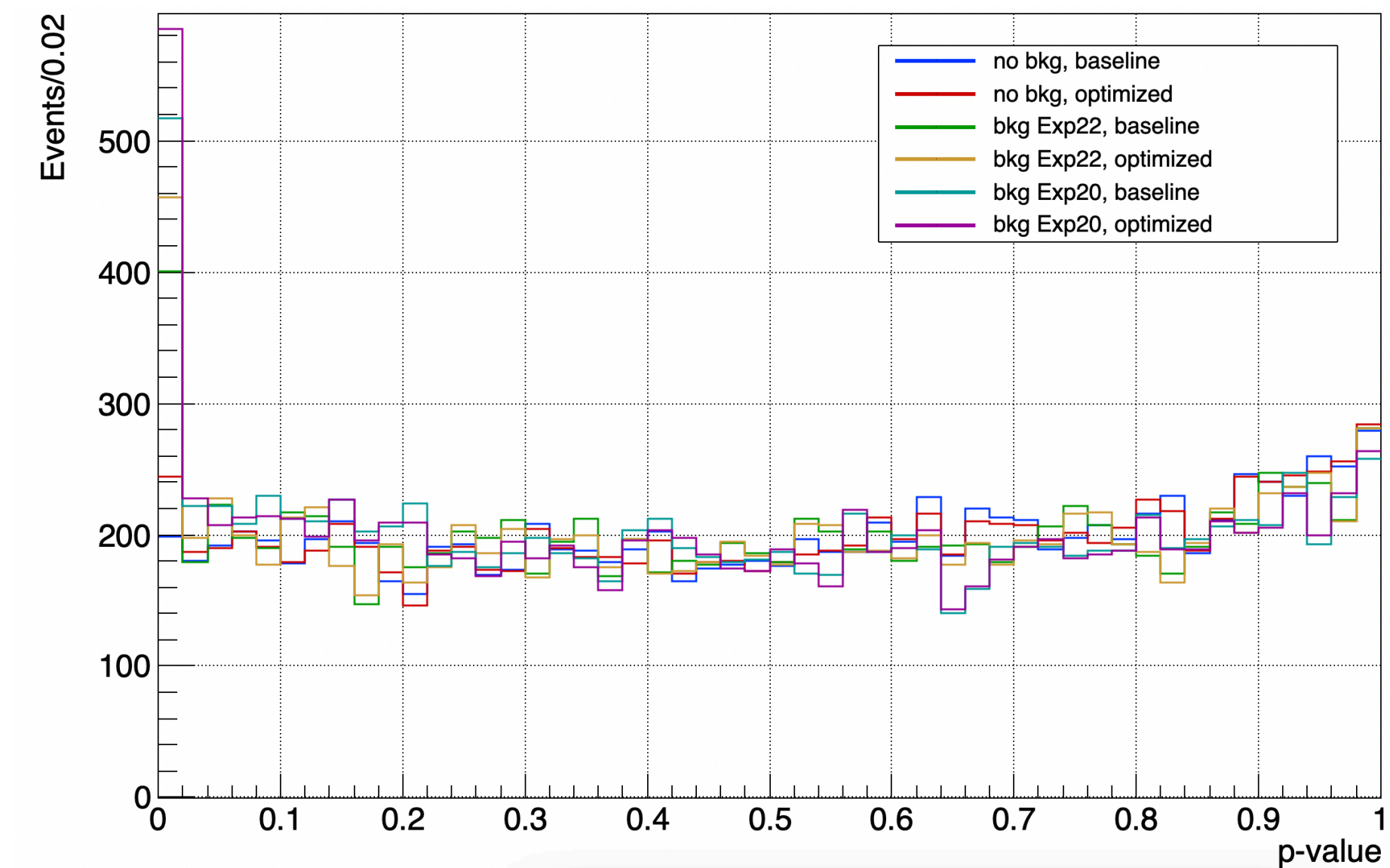
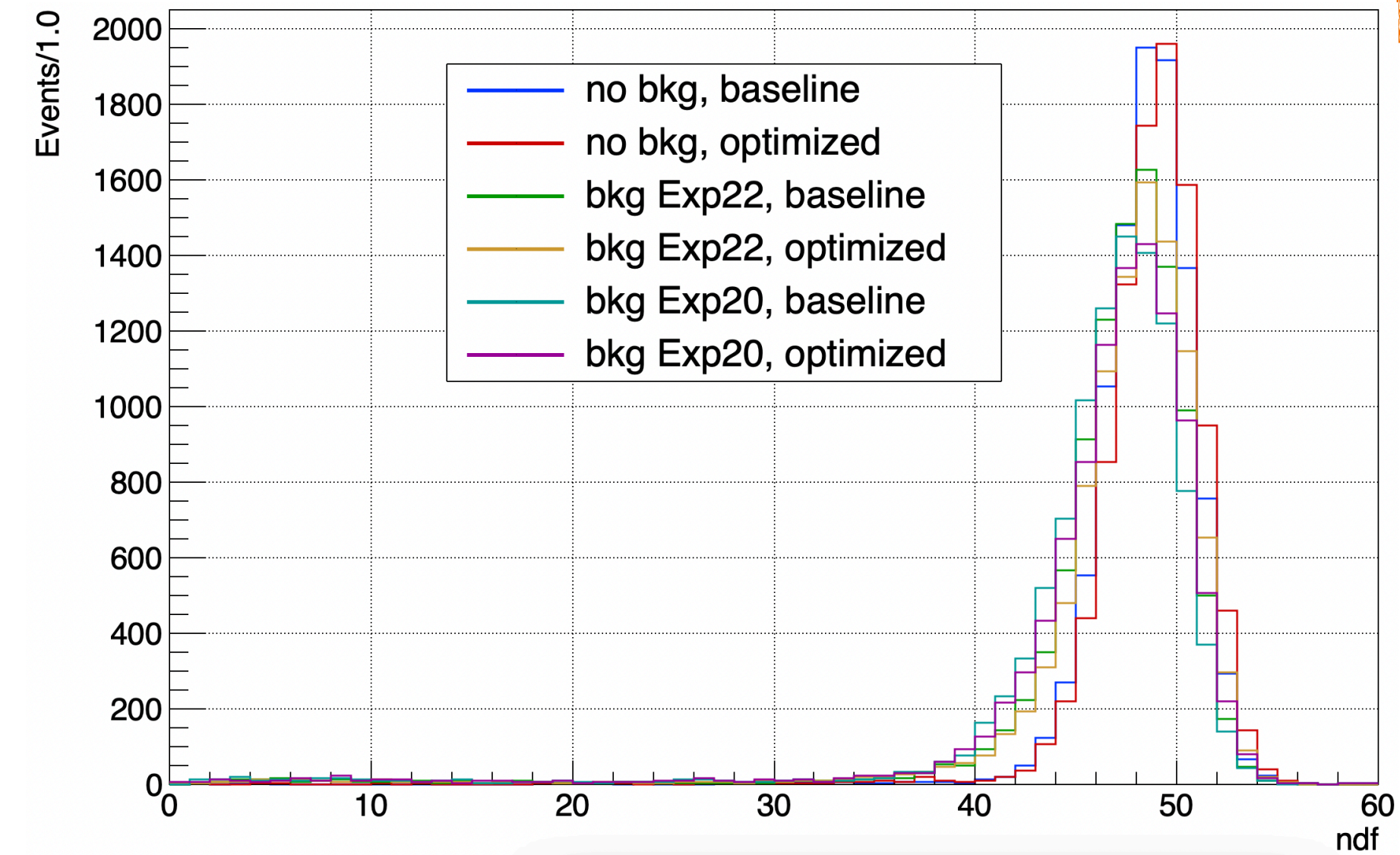
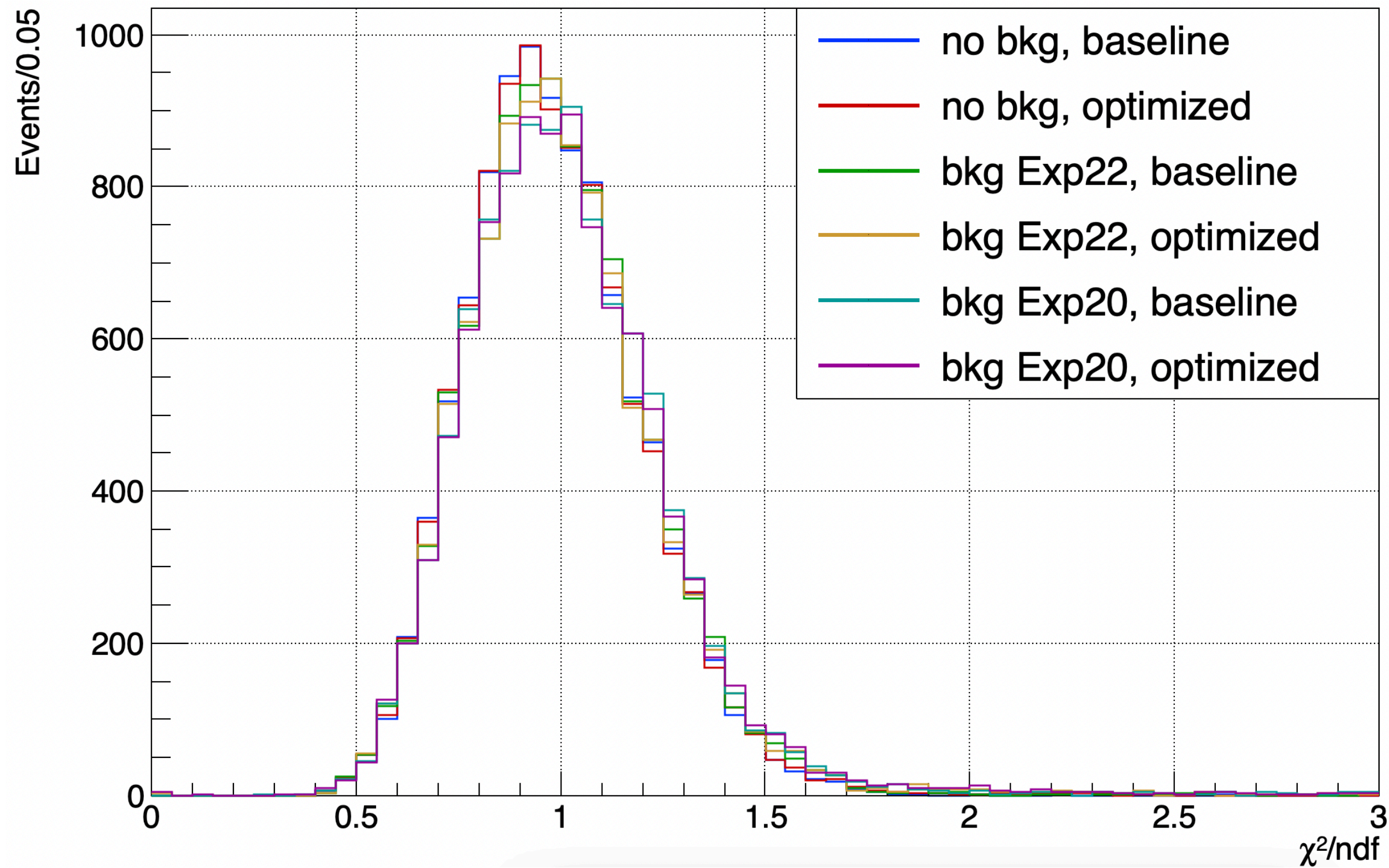
- Test condition:
- CDC only tracking
  - Muon Gun
  - $p_T=1$  GeV





# Optimization performance (tracking 2/2)

- Test condition:
- CDC only tracking
  - Muon Gun
  - $p_T=1$  GeV
  - $\theta = 70^\circ$





# Timing performance is different condition

	Combined_DAFRecoFitter (ms/ev)
DAF (no bkg)	10.5
DAF (exp20 bkg)	10.3
fit without DAF (no bkg)	2.2
fit without DAF (exp20 bkg)	2.3