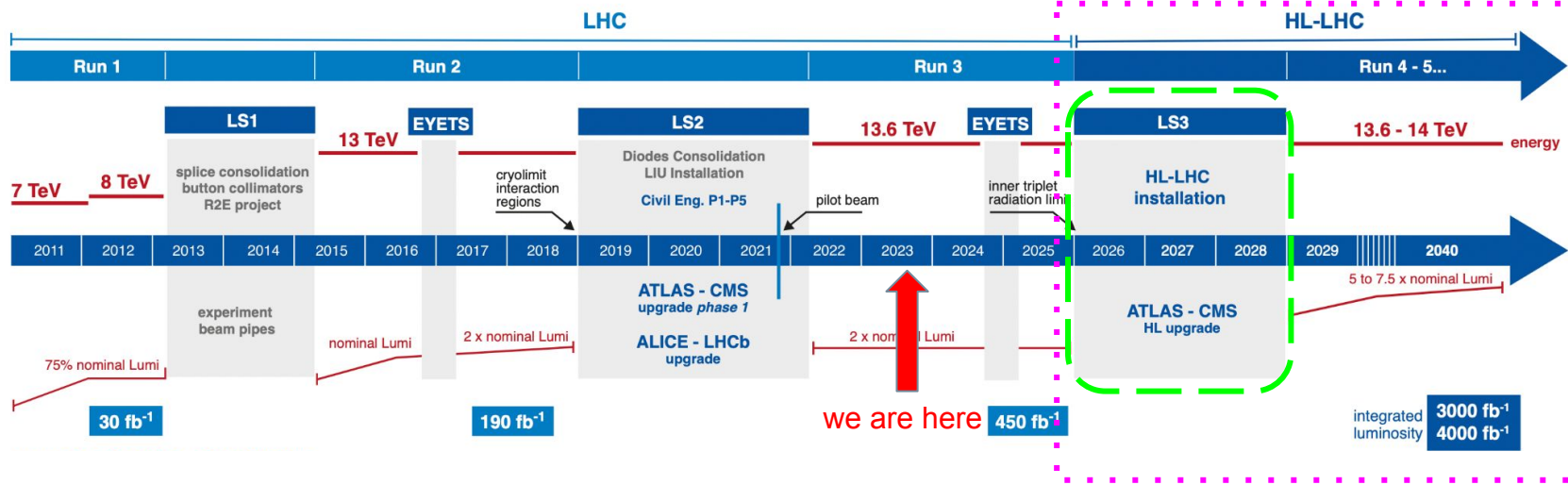


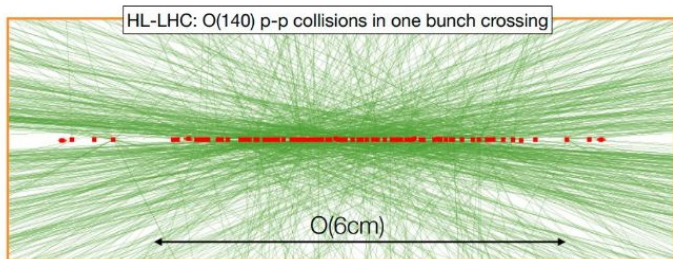
# KALMAN FILTER FOR MUON RECONSTRUCTION IN THE CMS PHASE-2 ENDCAP CALORIMETER

Mark Matthewman  
on behalf of the CMS Collaboration

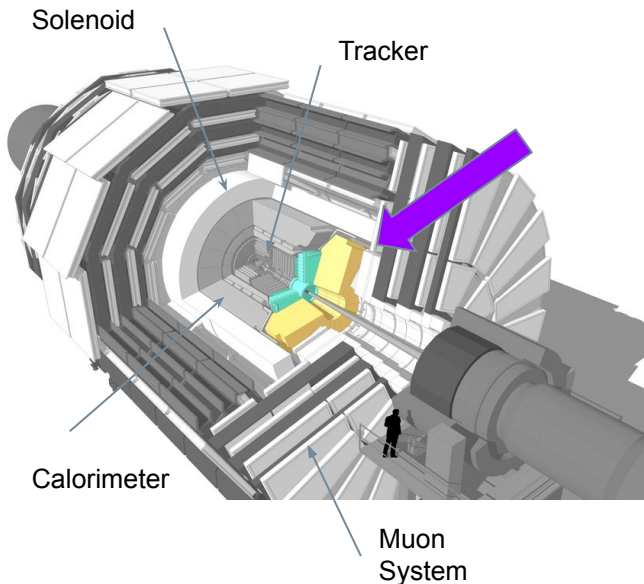
12.10.2023  
Connecting the Dots



- High-Luminosity Phase of Large Hadron Collider (**HL-LHC**) will increase instantaneous luminosity by 7.5 and collect 3000 fb<sup>-1</sup>
- High multiplicity environment challenging for both software and hardware
  - Pileup (PU) of O(200)
  - Radiation levels: 1 year of HL-LHC ~ 10 years at LHC
- **Phase-2 upgrades** for the CMS and ATLAS experiments need to be installed



- To deal with **high multiplicity environment**, CMS needs
  - Major upgrades to barrel calorimeters, muon system and MIP timing detectors
  - Complete replacements of endcap calorimeters and tracker

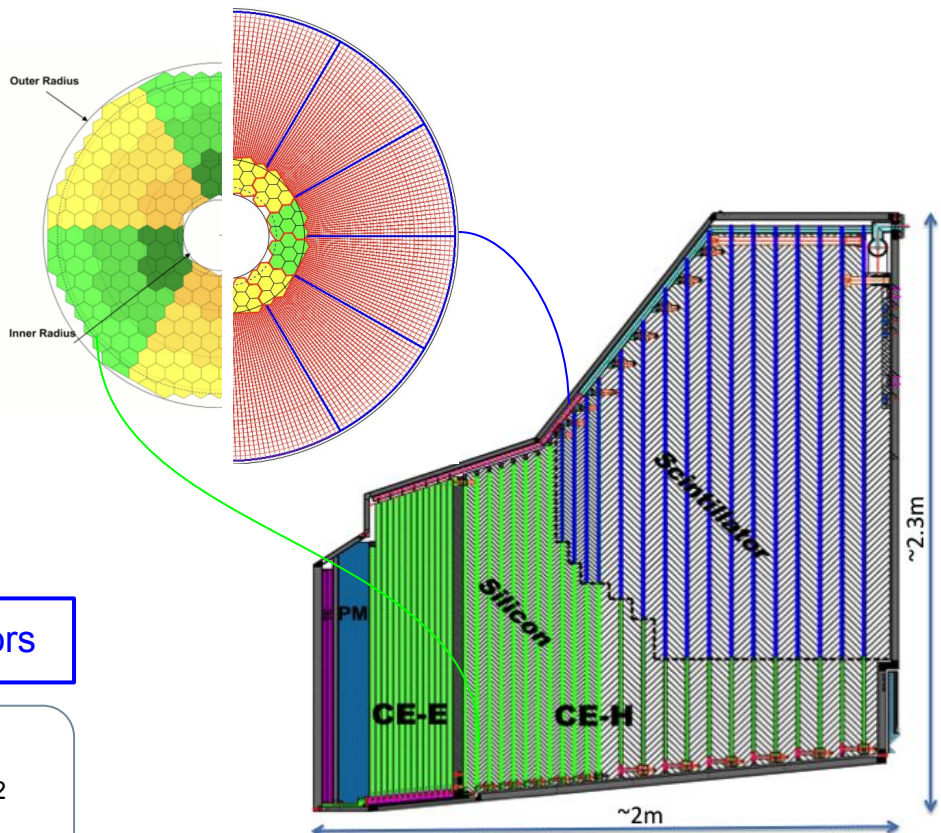


## High Granularity Calorimeter (HGCal)

- ✓ radiation tolerant
- ✓ dense to preserve lateral compactness
- ✓ fine lateral and longitudinal granularity for noise reduction and improved shower separation
- ✓ precise time measurements for reconstruction and PU mitigation



- Sampling calorimeter covering  $1.5 < \eta < 3.0$
- CE-E
  - 26 layers of hexagonal **silicon** modules
  - Pb, steel, Cu absorber plates
- CE-H
  - 7 + 14 layers of silicon modules and mixed silicon/**scintillator** tiles+SiPM modules
  - steel absorber plates



Silicon

Scintillators

Thickness: 120, 200, 300  $\mu\text{m}$

Area: 0.52, 1.18  $\text{cm}^2$

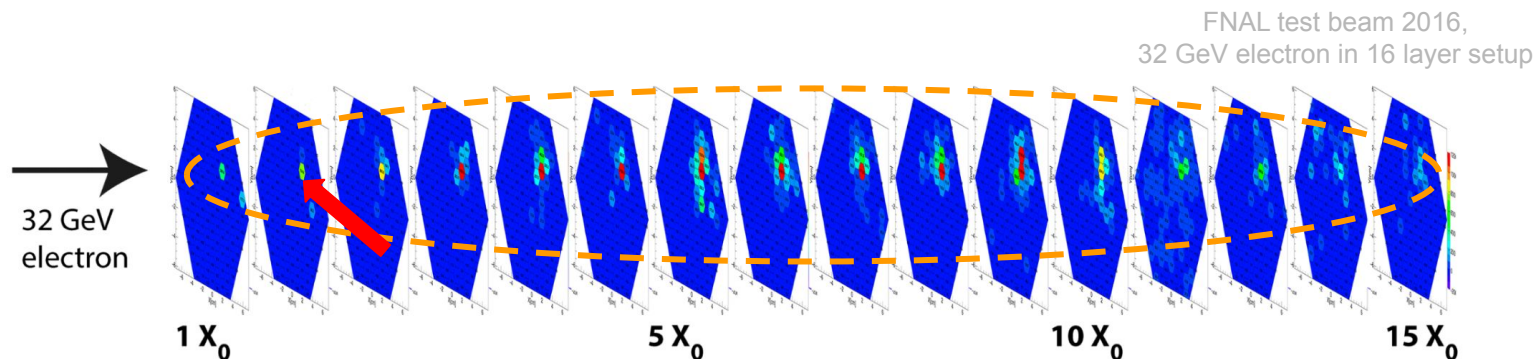
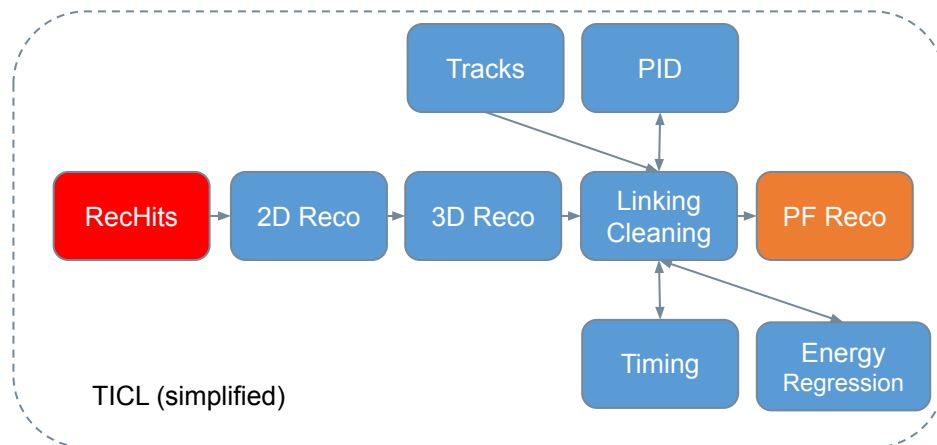
# Sensors: ~ 6 M

4 - 30  $\text{cm}^2$

~ 320 k

CE-E: Electromagnetic Endcap Calorimeter  
 CE-H: Hadronic Endcap Calorimeter

- Novel reconstruction framework (TICL) in CMSSW
  - exploits HGCAL design
  - designed w. heterogeneous computing in mind
- Reconstruct **particle flow objects** from 5D **RecHits**  $\{x,y,z,E,t\}$
- Modular framework allows multiple iterations targeting different particles

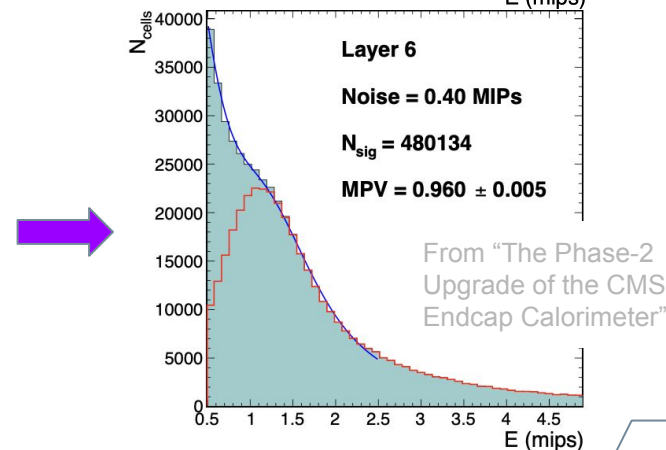
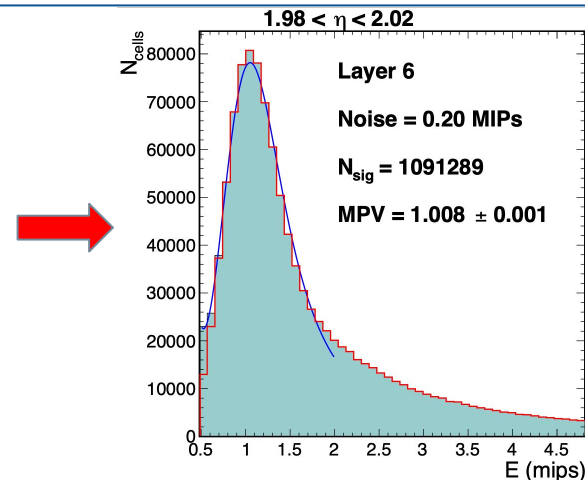


## Intercalibration

- Regular intercalibration necessary to preserve energy resolution
- General Procedure:
  - Identify cells passed by a MIP (muon)
  - Calculate calibration factors from **Landau-Gauss fit** of MIP energy deposits
  - **Equalize response** using calibration factors
- Precise muon tracking valuable tool for identifying MIP cells with **low S/N** (radiation exposure)

## Increase $\eta$ coverage

- Together with the Tracker and new ME0 muon chamber cover  $\eta > 2.4$



# MUON RECONSTRUCTION USING KALMAN FILTER

## Create initial Trajectory State On Surface (TSOS)

- Extrapolate track from tracker to first layer of HGCal

## Prediction Step

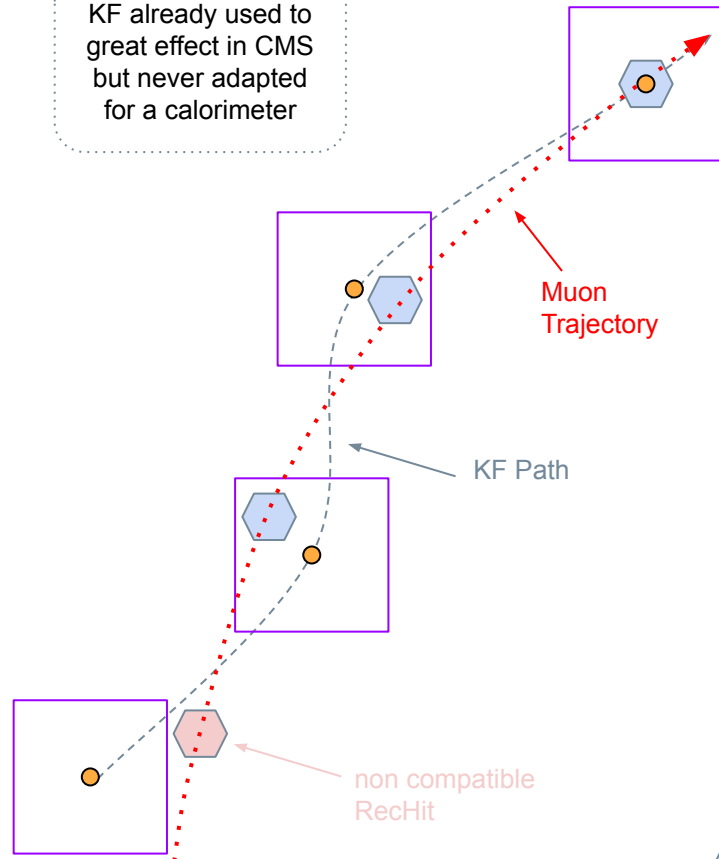
- Propagate **TSOS** (incl covariance matrix) to next layer w. Analytical Propagator
- Incl. magnetic field
- Incl. multiple scattering & energy loss

## Update Step

- Find candidate RecHits in **search window**
- Select **compatible RecHit** with lowest  $\chi^2$  score below fixed threshold (30)
- Update TSOS (incl covariance matrix) w. compatible RecHit incl. local error of sensor

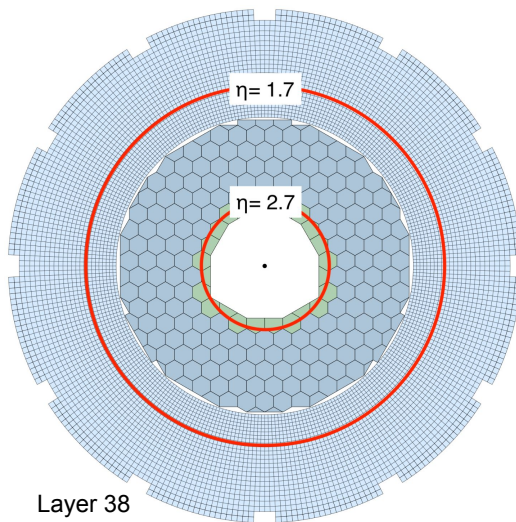
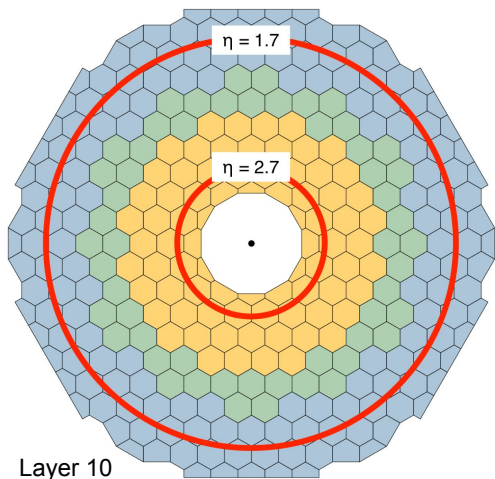
## Output Trajectory

KF already used to great effect in CMS but never adapted for a calorimeter

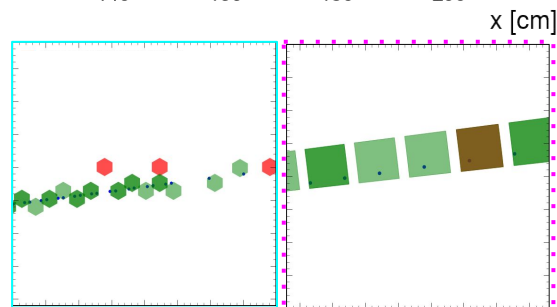
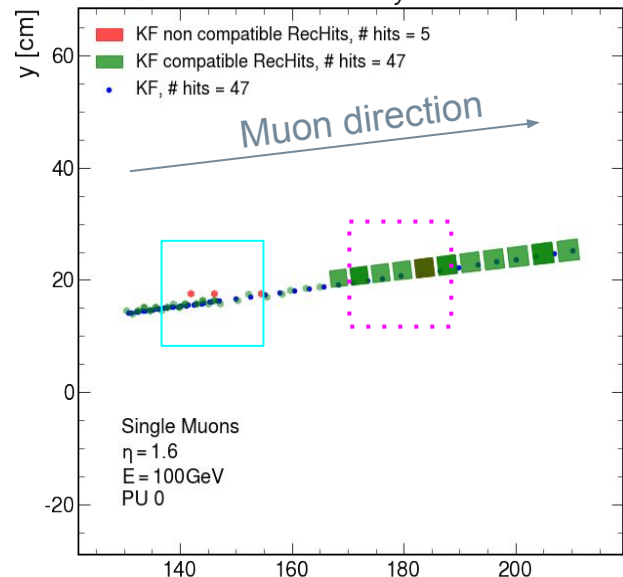




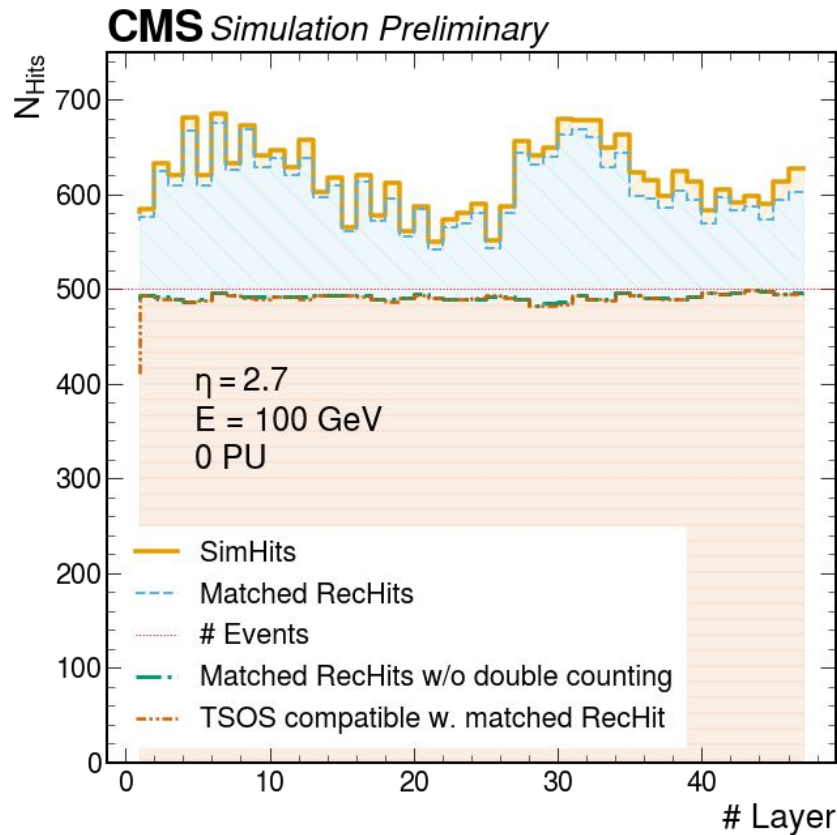
- Single muons generated from the vertex for fixed energies and eta regions
- KF algorithm implemented in an in-out fashion, starting from the tracker
- Standalone Propagator only using the prediction step was run for comparison



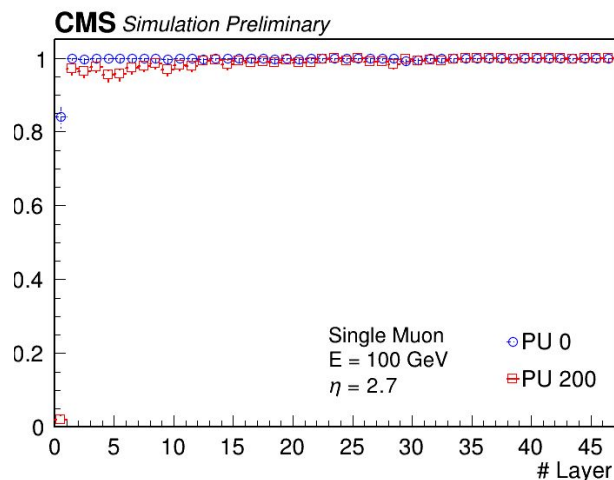
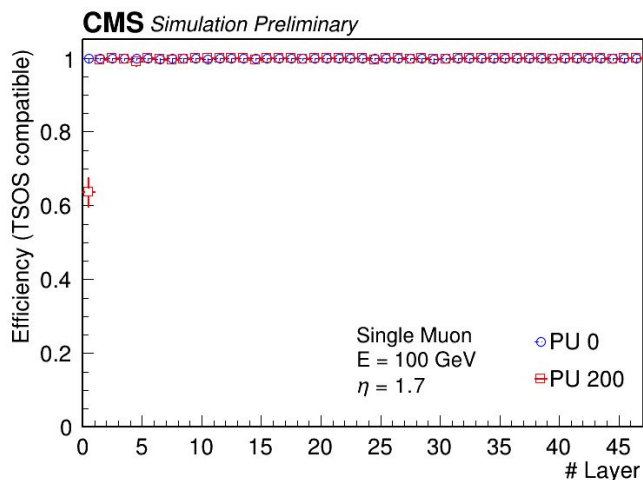
CMS Simulation Preliminary



- Energy deposits
  - **SimHits**: energy deposits in detector from simulated signal
  - **Matched RecHits**: calibrated detector response to the SimHits
  - Multiple SimHits/RecHits per layer, mainly due to radiation
- Reconstructed trajectory from KF
  - TSOS: state vector created in the prediction and update step
  - At most one RecHit **compatible** with the **TSOS**
- **Matched RecHits w/o double counting** count at most one matched RecHit per layer



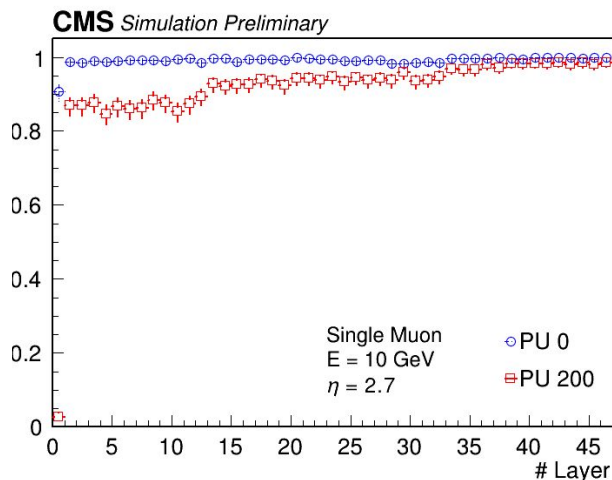
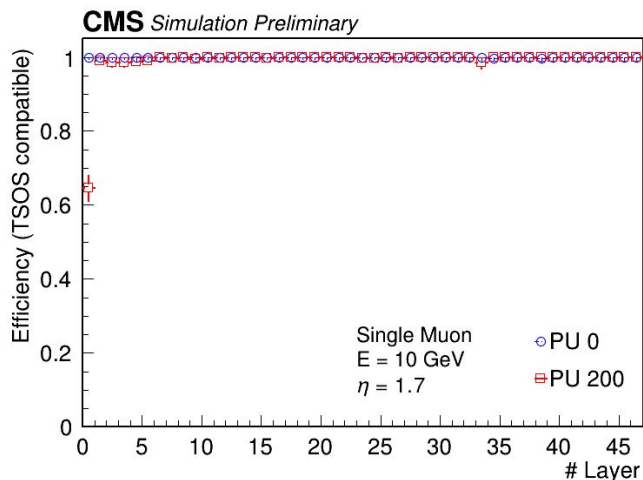
- Does the KF pick up the correct RecHit? → Efficiency (TSOS compatible)
- The KF is **efficient** for low and high PU
  - For low PU, high efficiency for different eta regions independent of energy
  - For high PU, lower efficiency for first couple of layers, especially for high eta regions and low energies (next slide)
  - Work is ongoing to better understand the inefficiency at the first layer



## Efficiency (TSOS compatible)

Number of RecHits matched to a SimHit compatible with the TSOS from the KF over the number of RecHits matched to a SimHit w/o double counting. Compatible means that the RecHit is best amongst RecHits found in search window according to the  $\chi^2$  estimator.

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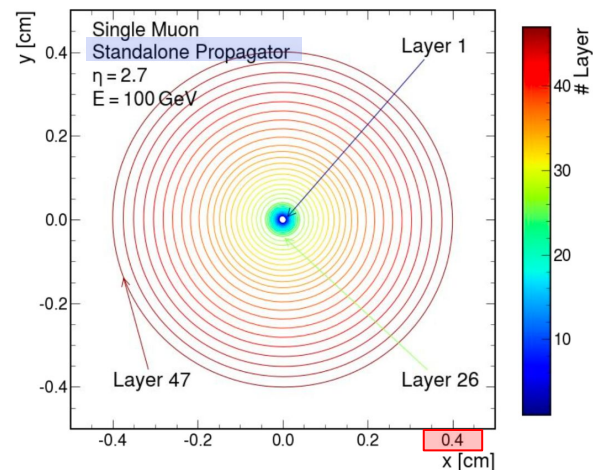
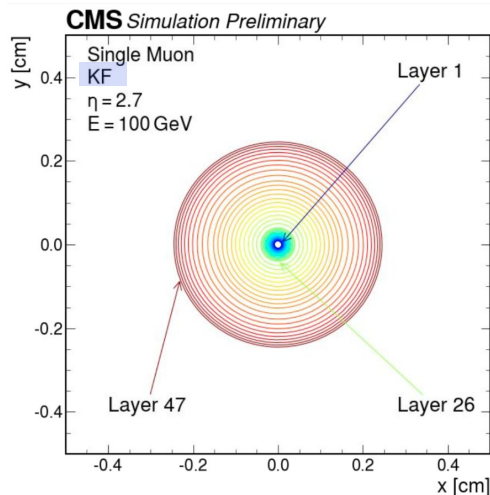
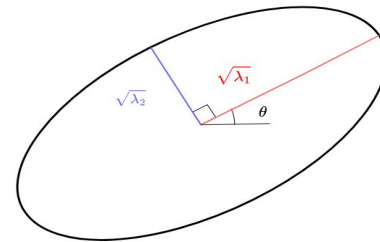
# COMPARISON WITH STANDALONE PROPAGATOR



- **Confidence ellipses visual representation of TSOS covariance matrix**
  - defined for x and y components
  - defined at 95% CL
- **General observations**
  - confidence ellipses increase with layer depth
  - Jumps occur at transition between different sections and sensors
- **KF outperforms Standalone Propagator**
  - KF increases less with layer depth than Standalone Propagator
  - Especially for low energies

## Confidence Ellipses

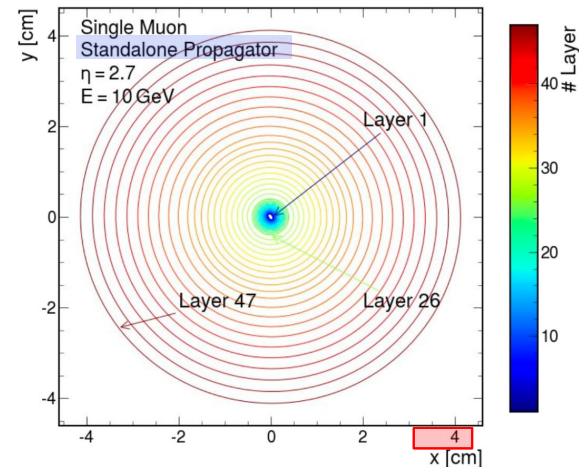
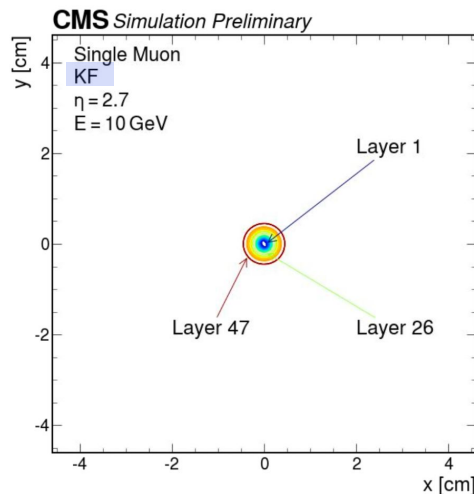
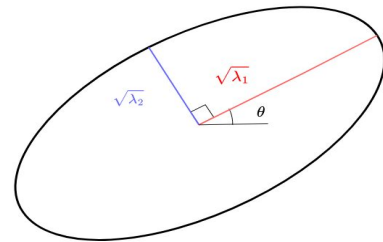
Ellipses visualizing the TSOS covariance matrix. Axes and angle are calculated from the eigenvalues.



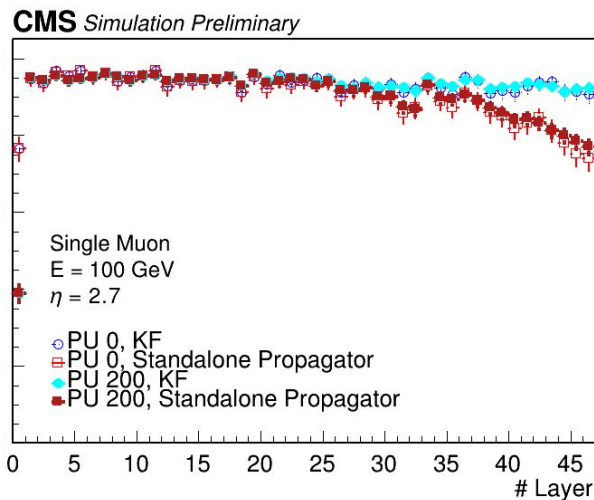
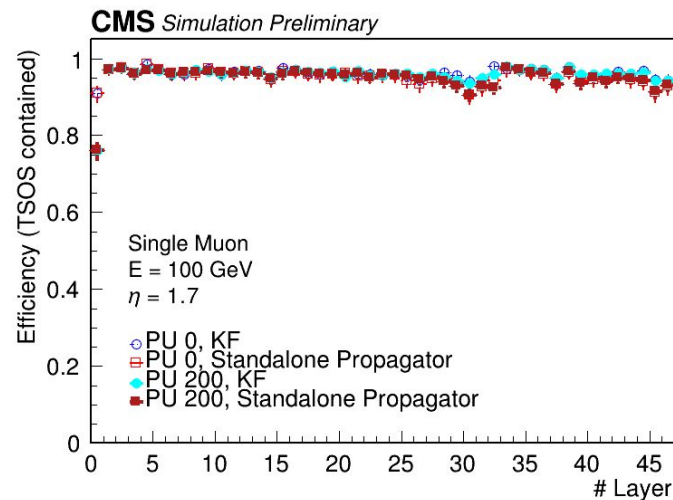
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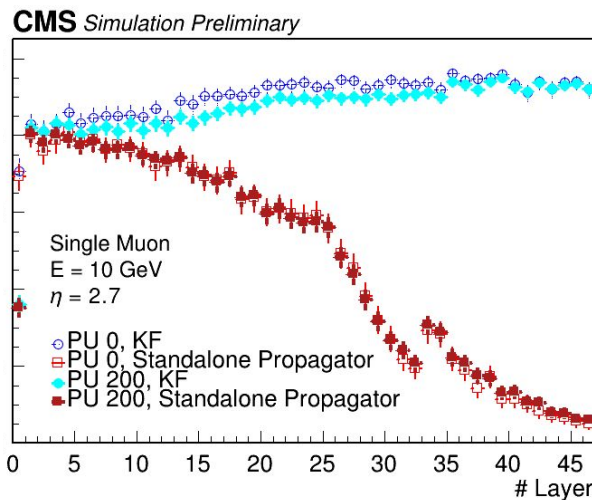
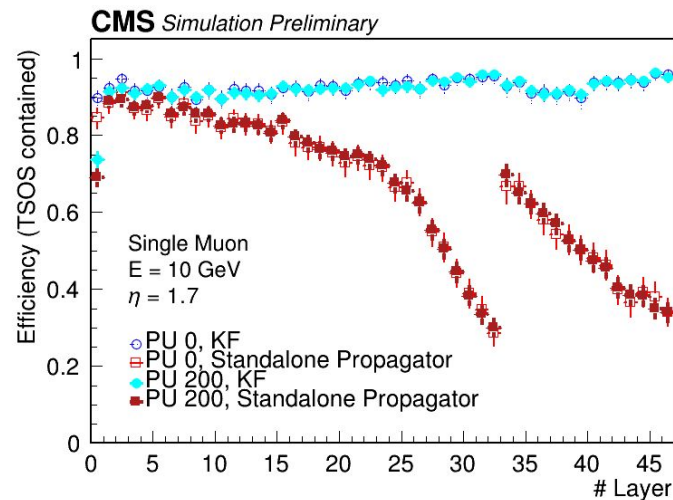
- Does the KF land in the sensor of the compatible RecHit? → Efficiency (TSOS contained)
- The KF is more efficient than the Standalone Propagator
  - Added precision of KF keeps efficiency high throughout HGCAL
  - Standalone Propagator efficiency drops off for the latter layers, low energies, and high eta regions



## Efficiency (TSOS contained)

Number of RecHits matched to a SimHit containing, within the boundaries of the associated sensor, the TSOS from the KF over the number of RecHits matched to a SimHit w/o double counting.

- Does the KF land in the sensor of the compatible RecHit? → Efficiency (TSOS contained)
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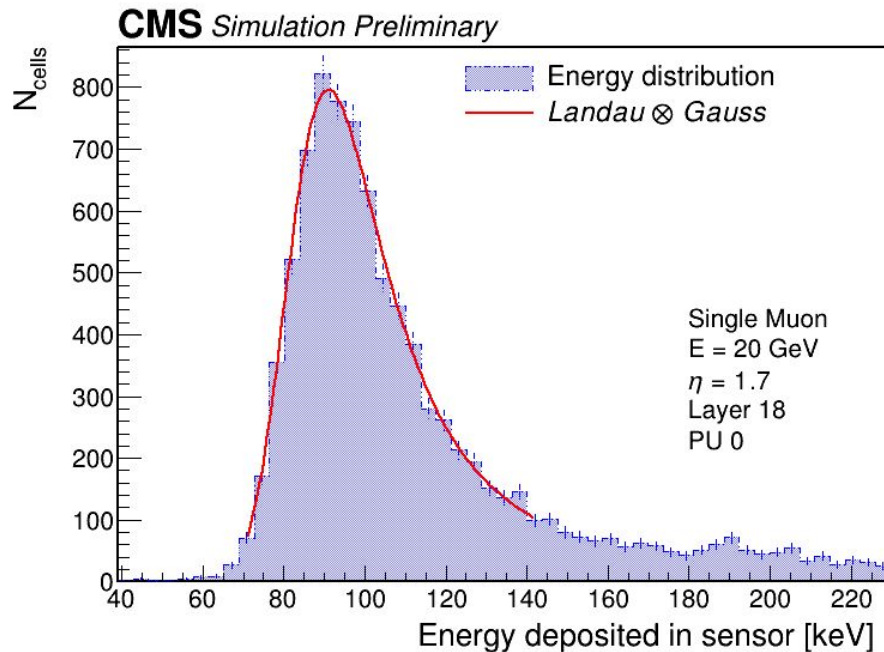
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# CONCLUSION AND OUTLOOK

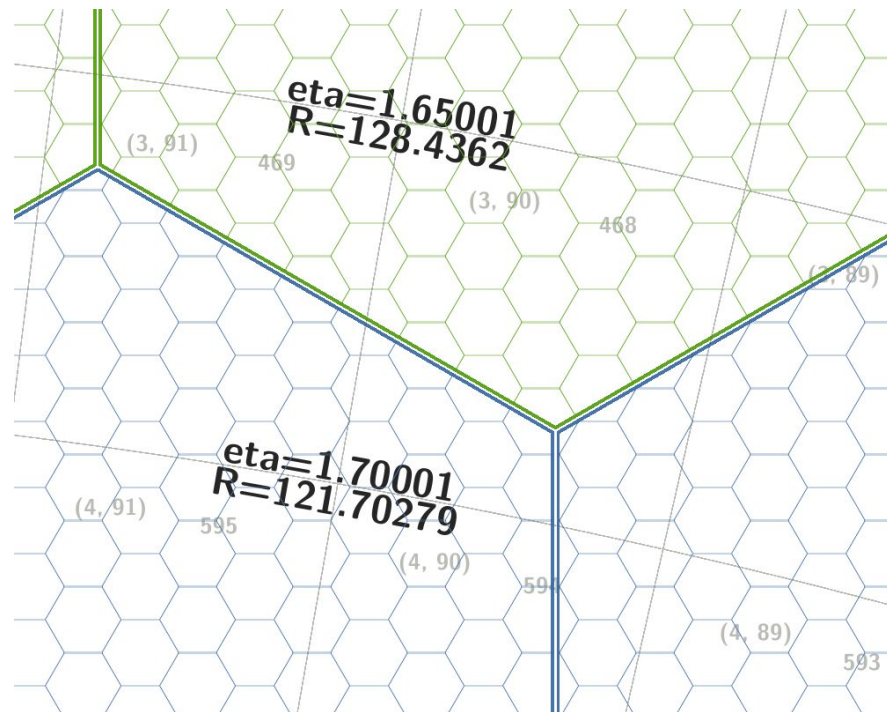


- Muon tracking in HGCal valuable tool for good inter-cell calibration
- KF for HGCal is currently being developed
  - uses material budget and complex magnetic field to allow precise tracking in a calorimeter
- First results are promising
  - KF outperforms Standalone Propagator
  - KF performs well for different energies, eta regions, and is robust for different levels of PU
- Next Steps
  - Compare KF position with exact position of the simulated muon
  - Systematic studies into cuts and thresholds for track selection and pruning
  - Out-In formalism starting from muon system
  - Define Intercalibration procedure



# BACKUP

- Fast querying of RecHits in the neighborhood of TSOS crucial for performance
- Tile structure with fixed ( $\eta$ ,  $\phi$ ) bins used to store RecHits
- Bins cover up to  $O(50)$  sensors  $\rightarrow$  much faster to query than entire layer
- KF search window:
  - Bin where TSOS lands
  - Based on  $\eta$ - $\phi$  of covariance matrix

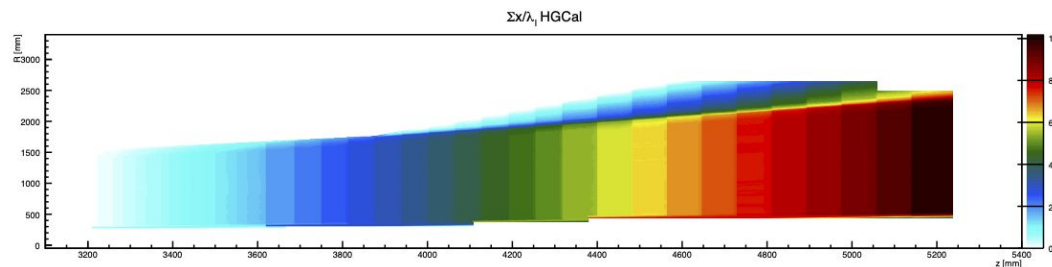
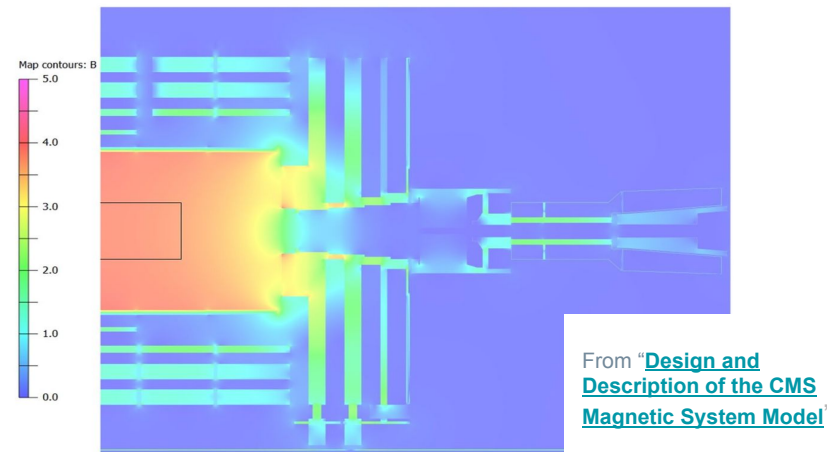


## Magnetic Field

- 3.8T magnetic field produced by solenoid magnet
- Return yoke designed to create closed magnetic circuit

## Material Budget

- Radiation length of CE-E:  $\sim 27 X_0$
- Total interaction length:  $\sim 10 \lambda$
- Cu, WCu, steel, and Pb with impact
- Material budget affects
  - covariance matrix via multiple scattering
  - state vector via energy loss



<https://hgcal.web.cern.ch/MaterialBudget/MaterialBudget/>