

# Particle Flow

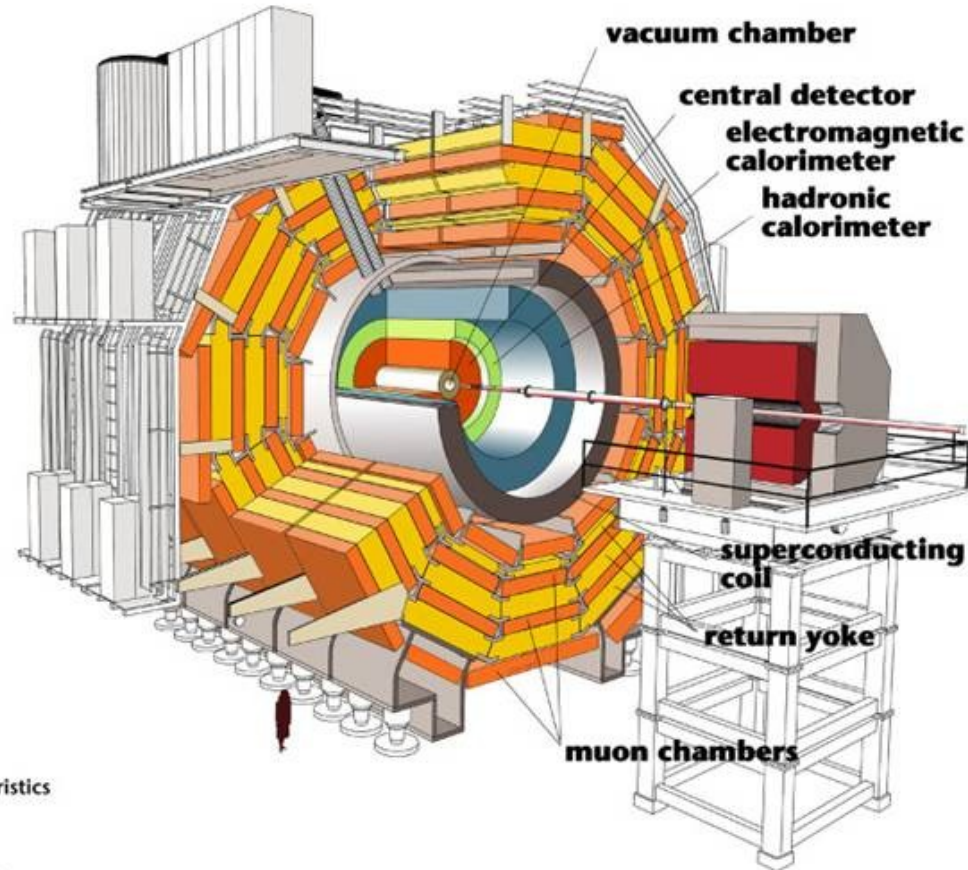
(Slides for morning discussion on particle flow)

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Saha Institute for Nuclear Physics

# Plan of the talk

- CMS detector
- Particle flow overview
- Particle flow steps
  - PF elements
  - PF linking and blocks
  - PF reconstruction of candidates
- Performance

# The CMS Detector



## Detector characteristics

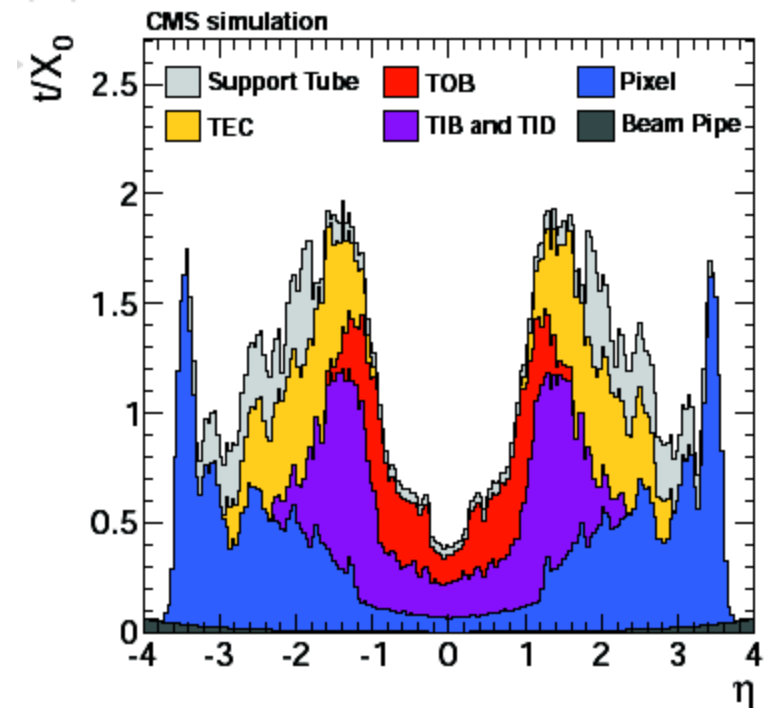
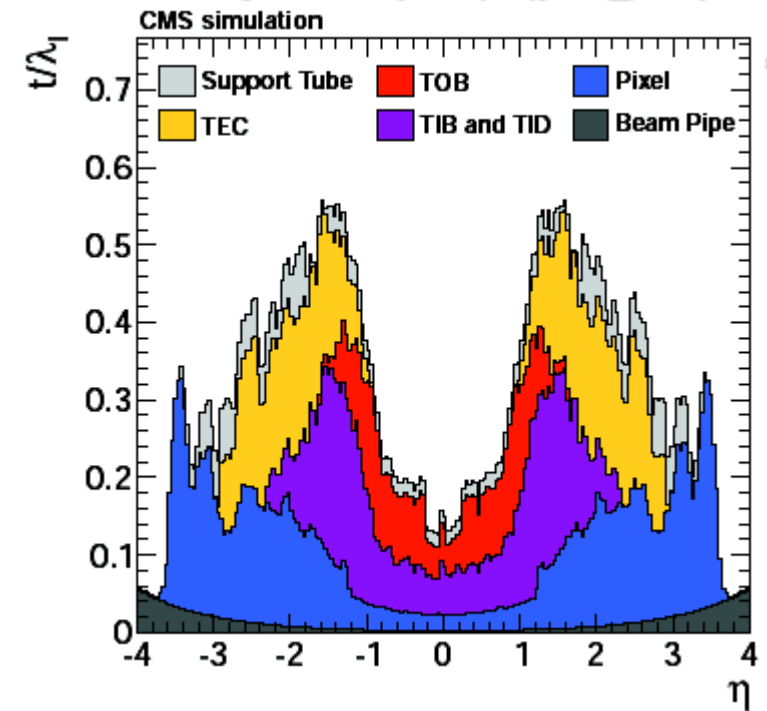
Width: 22m  
Diameter: 15m  
Weight: 14'500t

# CMS design goals

- **Muon chambers (and tracker):**
  - Good muon id over a wide pT range in  $|\eta| < 2.5$ ,
  - $\sim 1\%$  @ 100 GeV dimuon mass resolution
  - Charge id upto  $p < 1$  TeV
- **Tracker:**
  - Good charged particle momentum resolution and reconstruction efficiency
  - Tau, b jets tagging  $\rightarrow$  pixel layers close to interaction
- **EM calorimeter**
  - Dielectron mass resolution  $\sim 1\%$  @ 100 GeV
  - Coverage  $|\eta| < 2.5$
  - $\text{Pi}^0$  rejection, isolation at high luminosities
- **Hadron calorimeter**
  - Good missing ET and dijet mass resolution
  - Hermitic coverage  $|\eta| < 5$ , good dijet mass resolution,  $|\text{d}\eta| \times |\text{d}\phi| = (0.1 \times 0.1)$

# Magnet, tracker

- Magnet: 3.8 Tesla, 3.18 meter free bore radius
- HCAL, ECAL inside, no showering in magnet before calorimetry
- 66M 100X150 micron pixels and 9.6M 80 to 180 micron pitch strips within 1.2 m radius.
- Capable of closely spaced tracks within a jet
- At  $|\eta| = 1.5$  probability of a photon converting is 85%
- And a hadron doing a nuclear interaction is 20%
- Major challenge to overcome for particle flow



# ECAL

- Fine-grained (0.0175X0.0175 in etaXphi), clearly separated energy deposits from particles in a jet up to jet pT of the order of a TeV
- excellent resolution:  $\sim 0.3\%$  for high pT photons and electrons

$$\frac{2.8\%}{\sqrt{E}} \oplus \frac{12\%}{E} \oplus 0.3\%$$

# HCAL

- good geometric coverage ( $|\eta| < 5$ )
- can separate charged and neutral hadron energy deposits up to a jet  $p_T$  of 200-300 GeV
- modest resolution:  $\sim 9\%$  for high  $p_T$  jets
- fine-grained, clearly separated energy deposits from particles in a jet up to jet  $p_T$  of the order of a TeV

$$\frac{110\%}{\sqrt{E}} \oplus 9\%$$

# Muon chambers

almost perfect identification of muons

versatile muon tracking

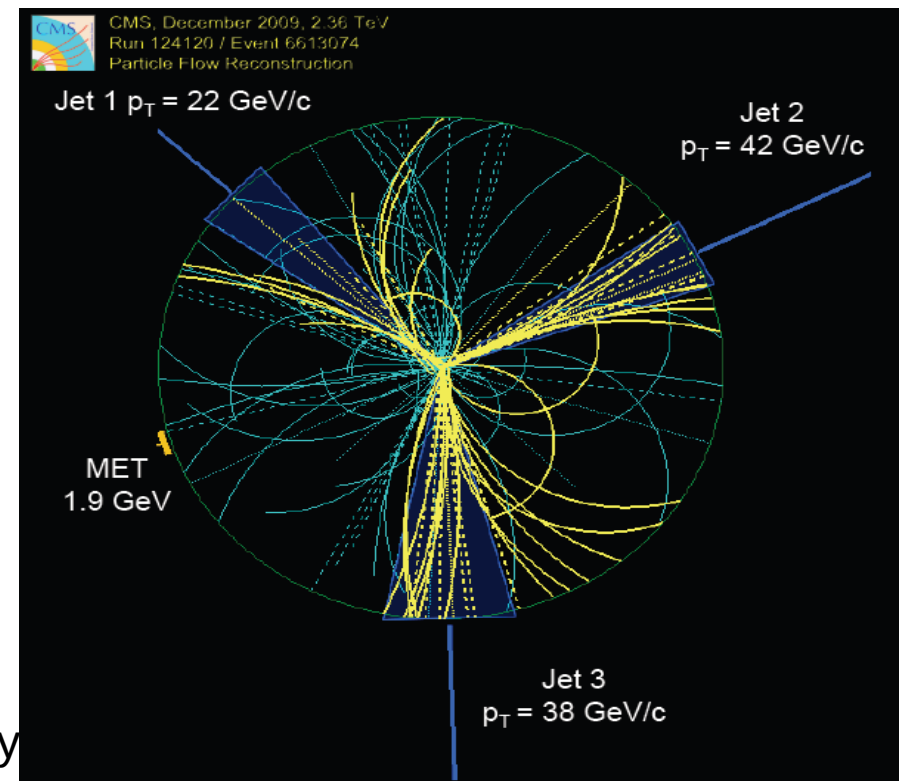
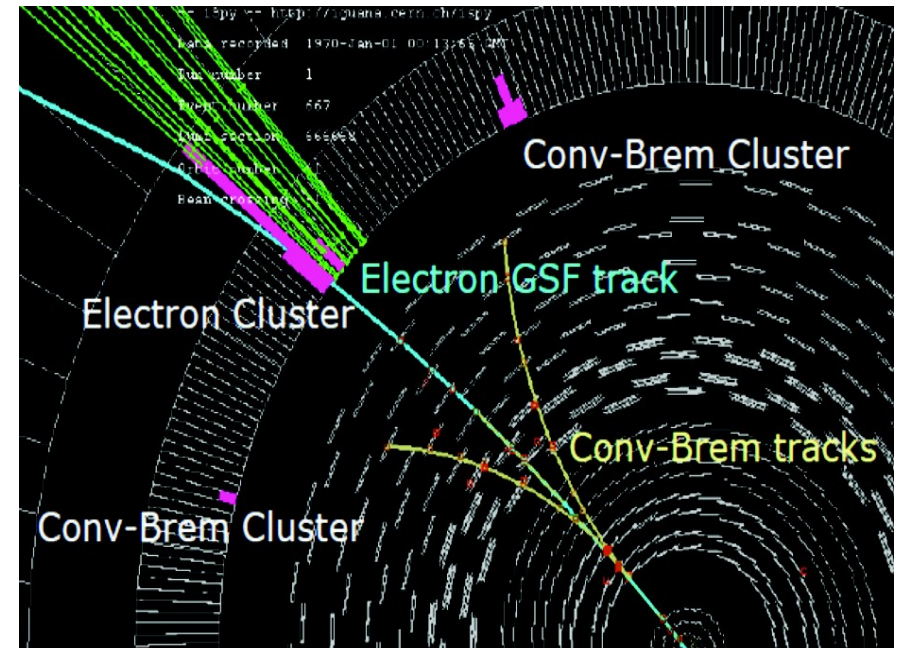
good dimuon mass resolution ( $\sim 1\%$  at 100 GeV)

unambiguous charge determination of muons with momentum  $< 1$  TeV

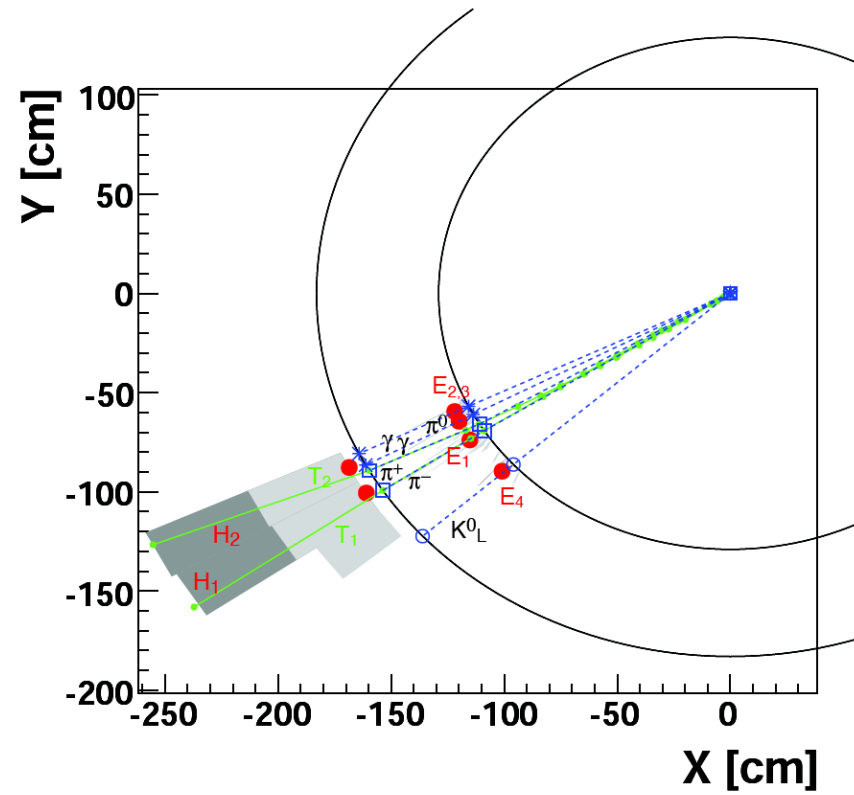


# Particle Flow

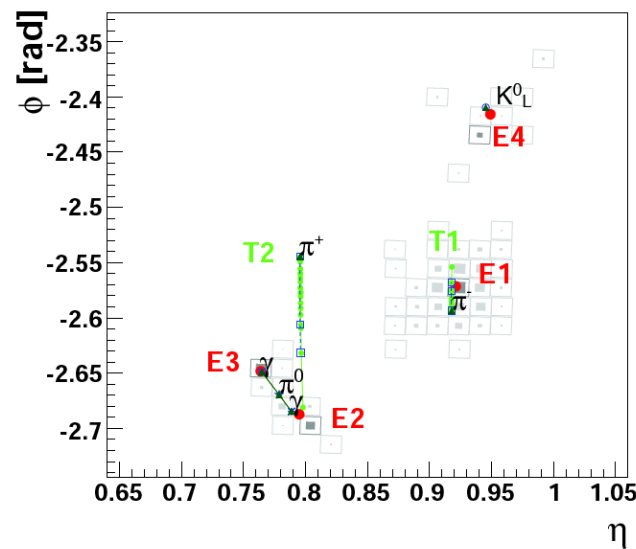
- Reconstruct all stable particles in CMS detector by linking responses of subdetectors
  - ▶ Photon, electron, muon, charged and neutral hadrons
  - ▶ Resulting list of particles can be used as if they came from a MC generator
  - ▶ Composite objects like jets, taus, MET can be reconstructed from the “PF candidates”



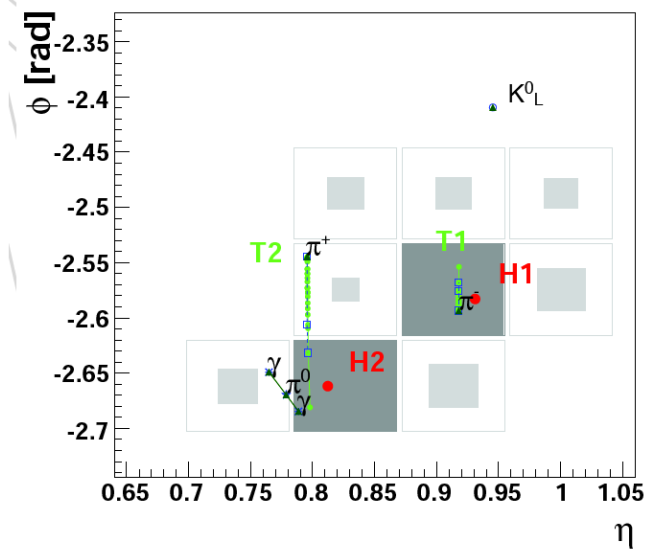
# A simple example



(a) The  $(x, y)$  view



(b) The  $(\eta, \phi)$  view on ECAL



(c) The  $(\eta, \phi)$  view on HCAL

# Particle Flow in CMS: History

(from a slide by Albert de Roeck, 2016)

- CMS was not designed having PF explicitly in mind.
- Interest started to develop ~ 2007 realizing the power of the tracker and ECAL (granularity) and the gain of PF
- The HCAL resolution in CMS is modest (2x worse than eg in ATLAS), hence important to reduce the impact of pure calo measurements.
- Particle Flow evolved with the years and was already validated on first MB data in 2009/2010 for the initial analyses. Now more than 90% of the analyses in CMS use full or partial PF (especially for jets and MET). We call it the “Global Event Description”
- Also used in Heavy Ion collisions analysis and at high pile-up! Planned for HL-LHC running with ~140 PU
- Used in part in the trigger (High-Level Trigger) eg jets, taus

# PF elements

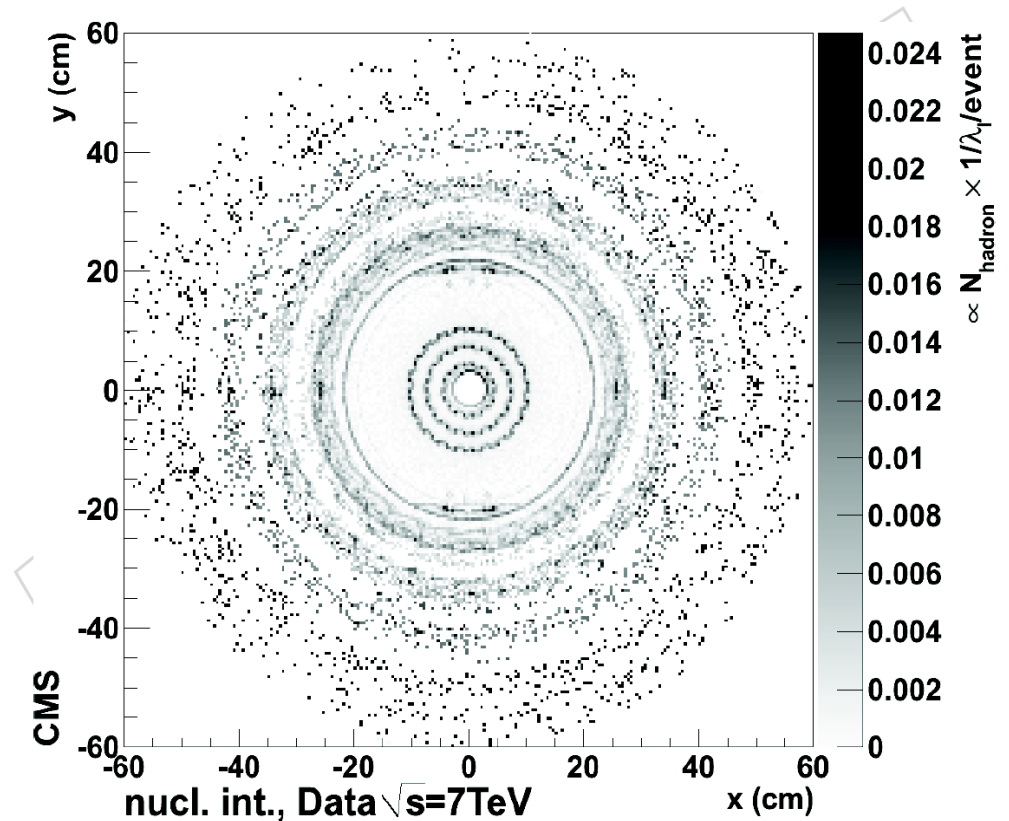
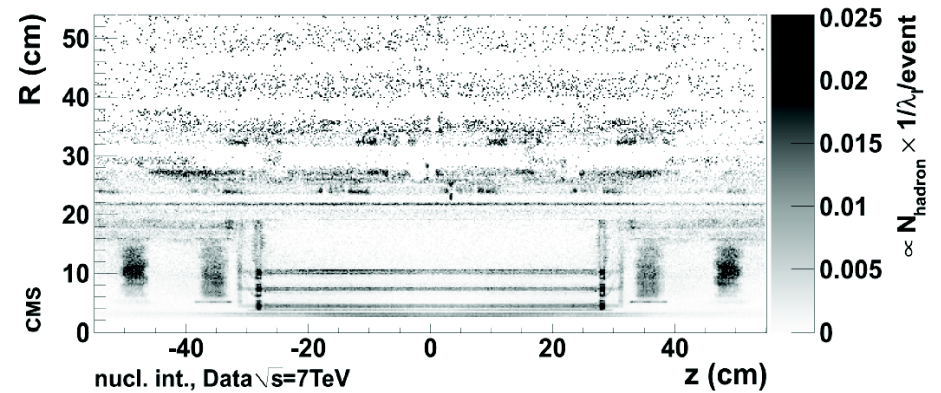
- MuCh tracks
- Tracker tracks
- ECAL clusters
- ES clusters
- HCAL clusters

# Traditional tracks

- Kalman filter based tracking
- Seed: two consecutive hits in three pixel layers
- $\geq 8$  hits, at most one missing hit on the way
- Each hit contributes  $< 30\%$  to track fit  $\chi^2$
- XY-dca few mm
- $PT > 0.9$  GeV

# interactions in tracker

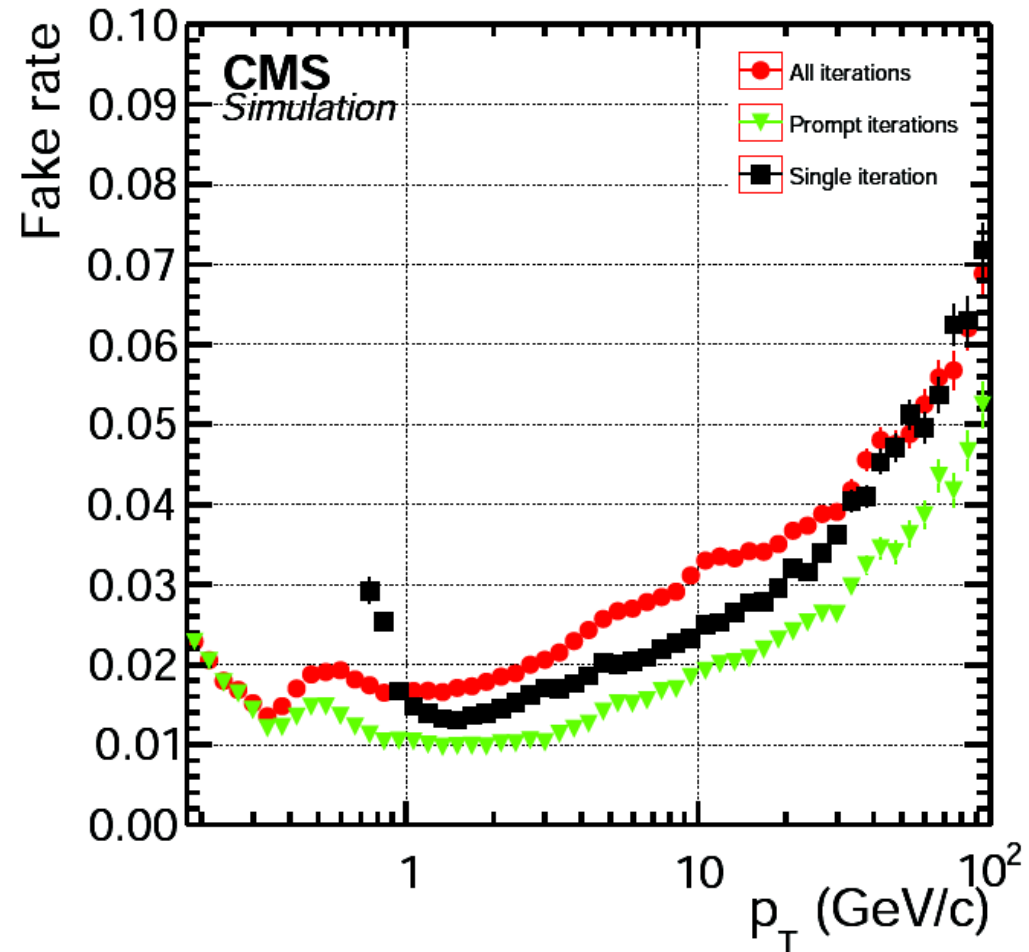
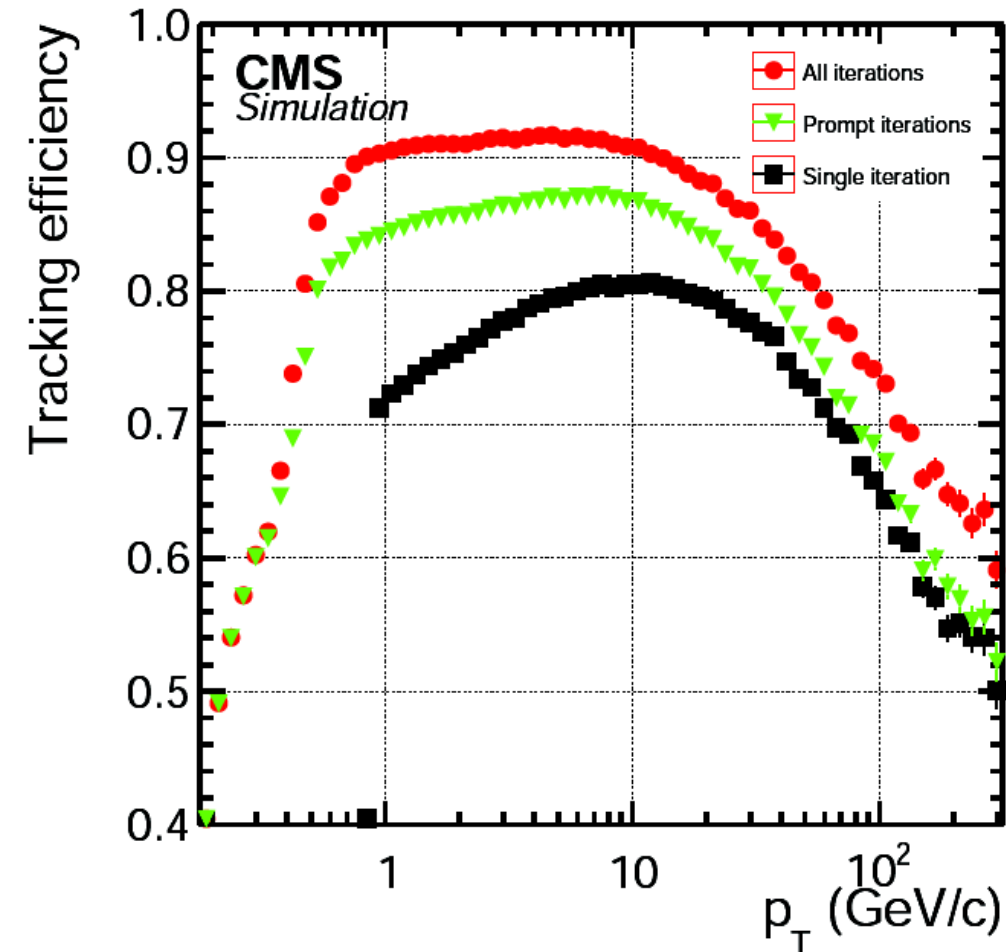
- Nuclear interactions can either produce a kink or give secondaries
- 2/3 of secondaries charged
- Will give displaced tracks
- Conversion of photons also will give displaced tracks



# performance

- Fake rate few percent, efficiency for  $\pi^{\pm} > 1 \text{ GeV}$  70-80%
- Probability of nuclear interaction before 8 hits 15-30% (loss of track)
- Tracking efficiency falls rapidly at higher  $p_T$ 
  - Limited by strip pitch for overlapping particles
  - Important loss for boosted and collimated jets
- About 2/3 of jet energy from charged tracks
- Inefficiency of 15% would increase neutrals by 10%, could worsen the energy resolution by 50%
- Also will bias the jet direction (shifted cluster position)

# Efficiency and fake rate





# Iterative tracking

- Loosen pT threshold, require fewer hits --> recover half of the tracks.
- **Fake rate increases 5 times** with pT threshold lowered to 300 MeV
- + require 5 hits --> **fake rate 80%**
- Solution: iterative tracking
- Start with tight tracks. Remove used hits. Relax criteria, do tracking with the remaining hits

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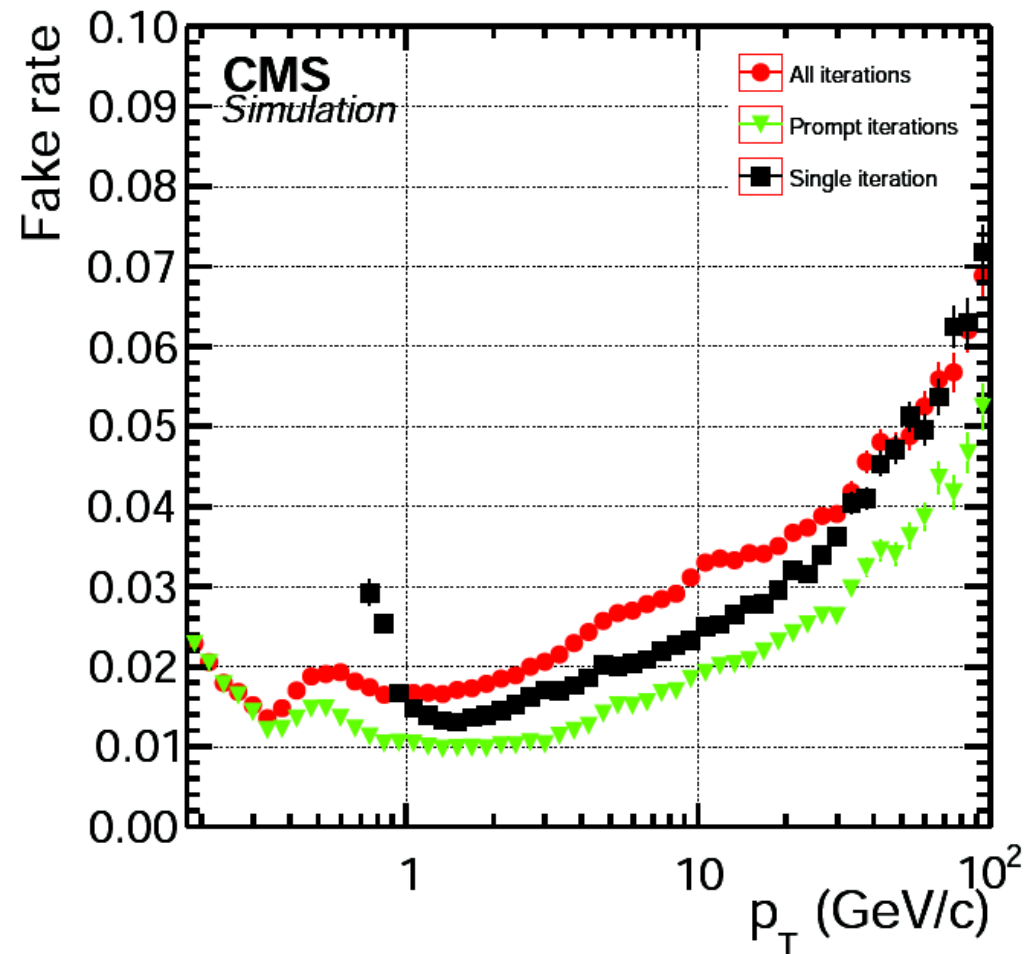
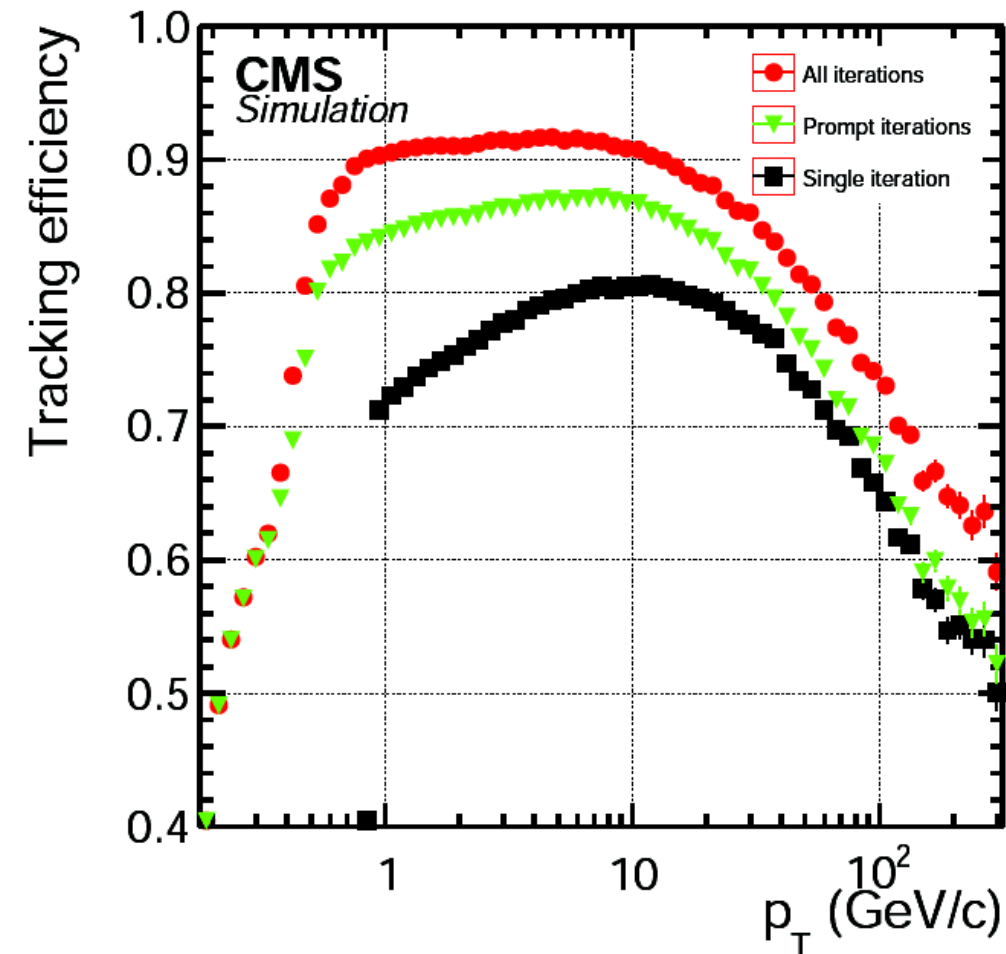
# Iterative tracking

- Seeded with pixel triplet for prompt, high pT
- Pixel triplet for displaced  $R < 5\text{cm}$
- Pixel triplet for prompt, low pT
- Pixel pair for recovering high pT
- pixel+strip triplet for displaced  $R < 7\text{cm}$
- Pixel+strip pair for displaced  $R < 25\text{cm}$
- Pixel+strip pair for displaced  $R < 60\text{cm}$
- pixel+strip pair for very high pT inside high pT jets
- Muon tagged tracks for recovering muons
- Muon chamber for recovering muons

# Iterative tracking performance

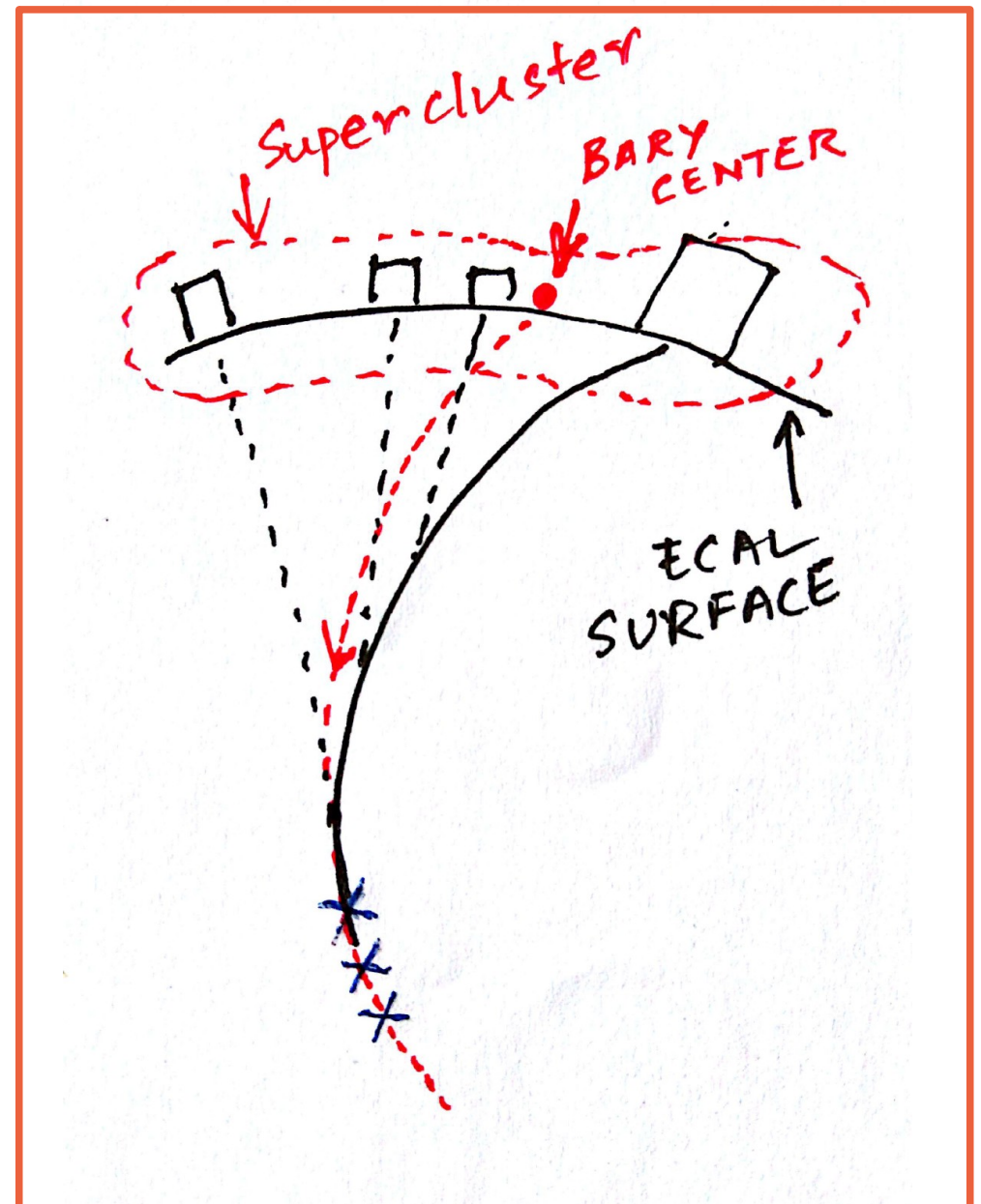
- First 3 iterations removes 40%(20%) hits from pixel(strips) retaining 80% efficiency
- Steps with  $\geq$  pixel hit (0-3,7) recover 50% of the tracks
- Lowers pT threshold from 900 MeV to 200 MeV
- Steps 5,6 recover nuclear interaction tracks, another 5% but adds **1% in fake rate**
- Twice faster
- **Fakes still an issue**, addressed in later stages

# Efficiency and fake rate



# Original electron tracking

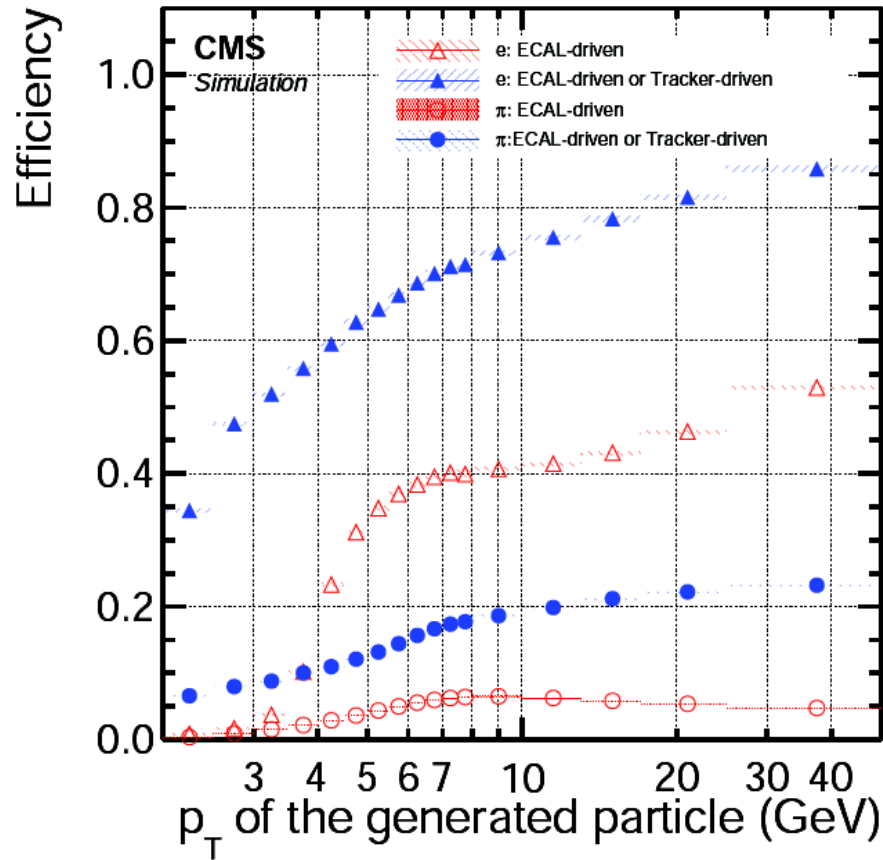
- ECAL seeded
- Simple rule for bremsstrahlung electrons: baricenter of all the ECAL clusters is on the original helix of the electron
- Success depends on superclustering
- Inefficient for electrons inside jets and many compatible seeds
- Biases baricenter for low  $p_T$  electrons



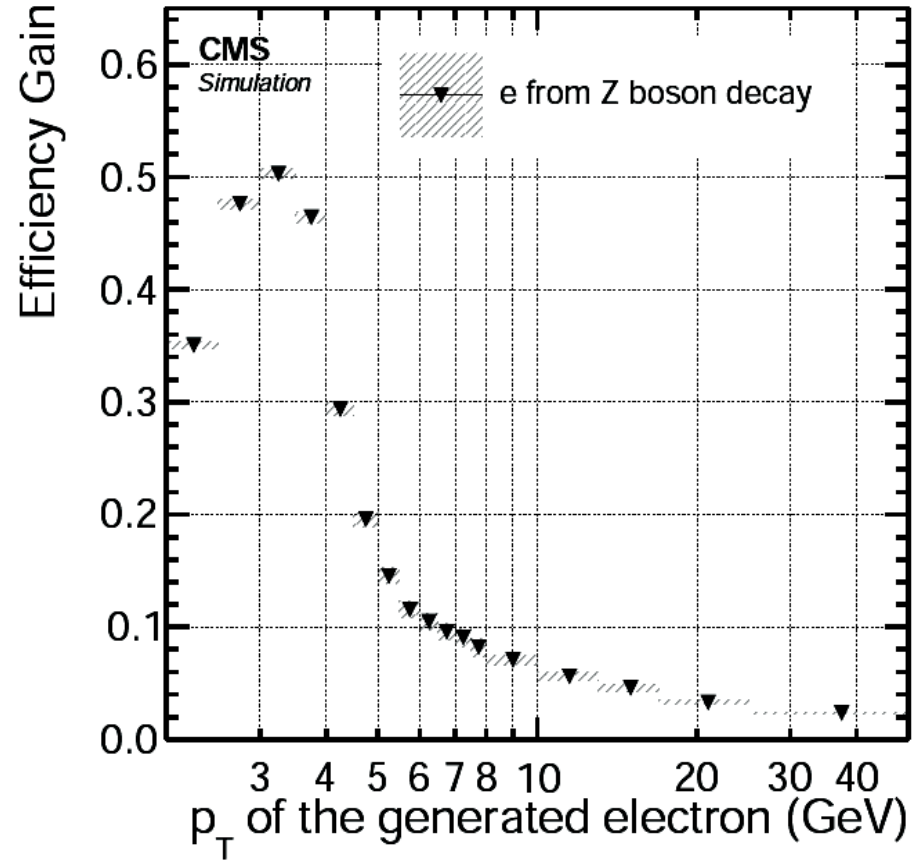
# Tracker seeded tracking

- Use iterative tracks as potential candidates
- Utilize brem information
- Unified list of tracker and ECAL seeded tracks is made
- Use gaussian sum filter to refit tracks (takes care of non-gaussian energy losses in tracker material)
- More on electron reco later...

# Electron seeding efficiency



(a)



(b)

CMS simulation: a) b jets in 80 to 170 GeV b) efficiency gain in electrons from Z



# Muon tracks

- Use muon chamber tracks and tracker tracks. Precise momentum from tracker tracks
- **Stand alone Muons**: tracks reconstructed from muon chamber hits (and track segments) only
- **Global Muons**: Done by matching stand alone muon track parameters with tracker track parameters on a surface where both are propagated
- **Tracker Muon**: consider all tracker tracks with  $p > 2.5$  GeV and  $p_T > 0.5$  GeV. Propagate to muon system. If one matching segment found it is tracker muon  
( $\text{pull} < 4$  or  $dx < 3$  cm in local x co-ordinate)
- Global + Tracker muon reconstruction efficiency is  $\sim 99\%$

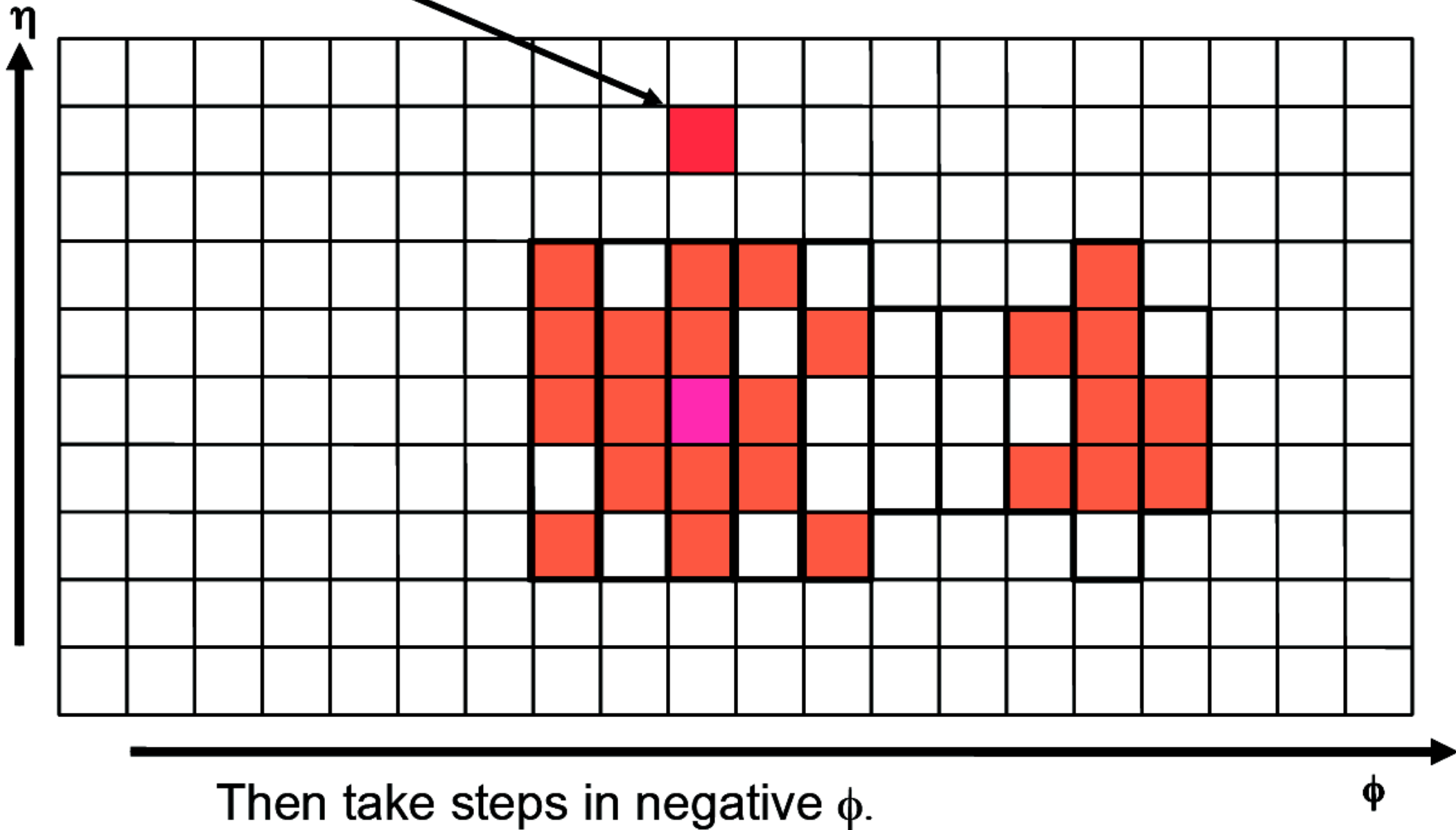
# Calo Clusters: Original clustering

- Contiguous set of cells around local maxima is calorimeter cluster.
- Dedicated superclustering in ECAL to recover brem and conversions in tracker
- Hybrid in barrel and multi5x5 in endcap

# Hybrid algorithm

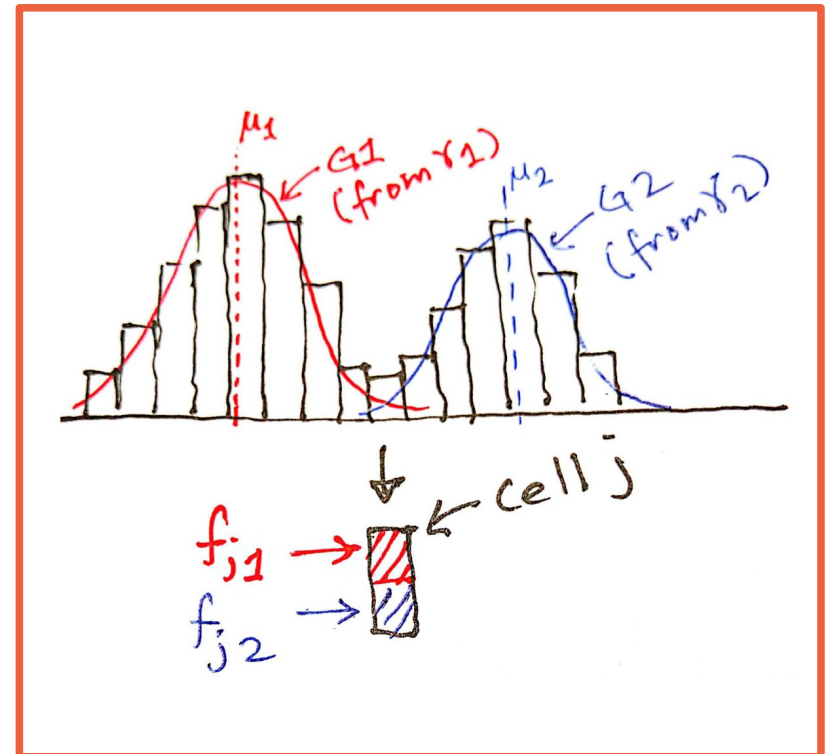
(slide from Andrew Askew)

Unclustered crystal.



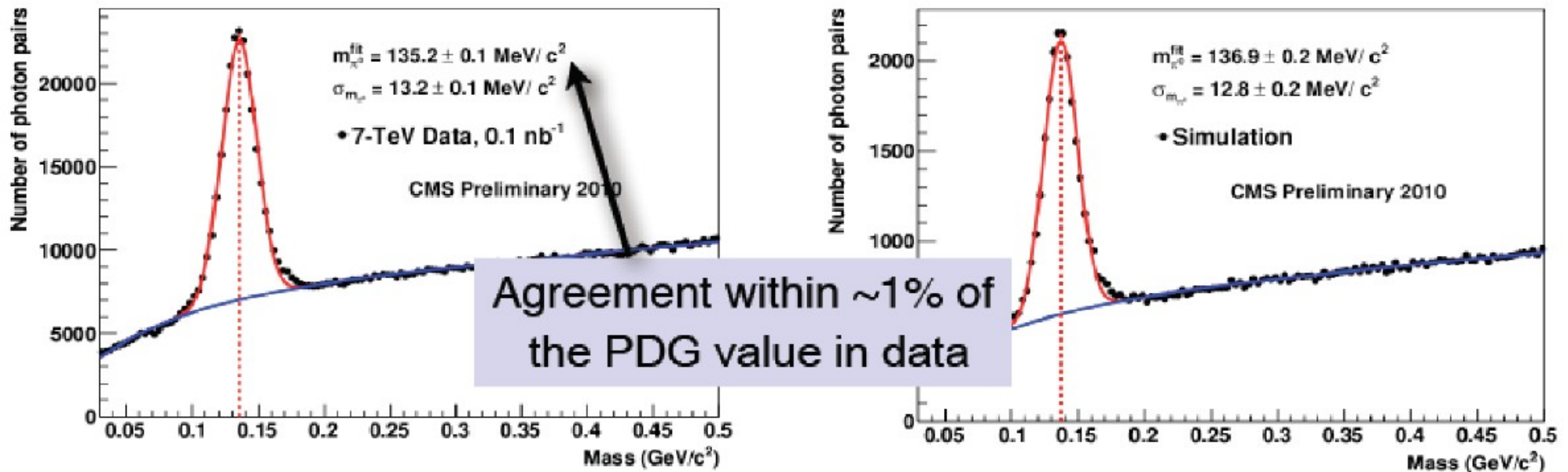
# PF: topological clustering

- PF uses a different approach:
  - Identify local maxima. Use expectation-maximization algorithm in eta-phi space, gaussian mixture model.
- E-step:
  - missing data is  $f_{ij}$ .
  - Update  $f_{ij}$  for present value of parameters  $\mathbf{A}_i$  and  $\mu_i$ .
- M-step: analytical likelihood maximization of the parameters



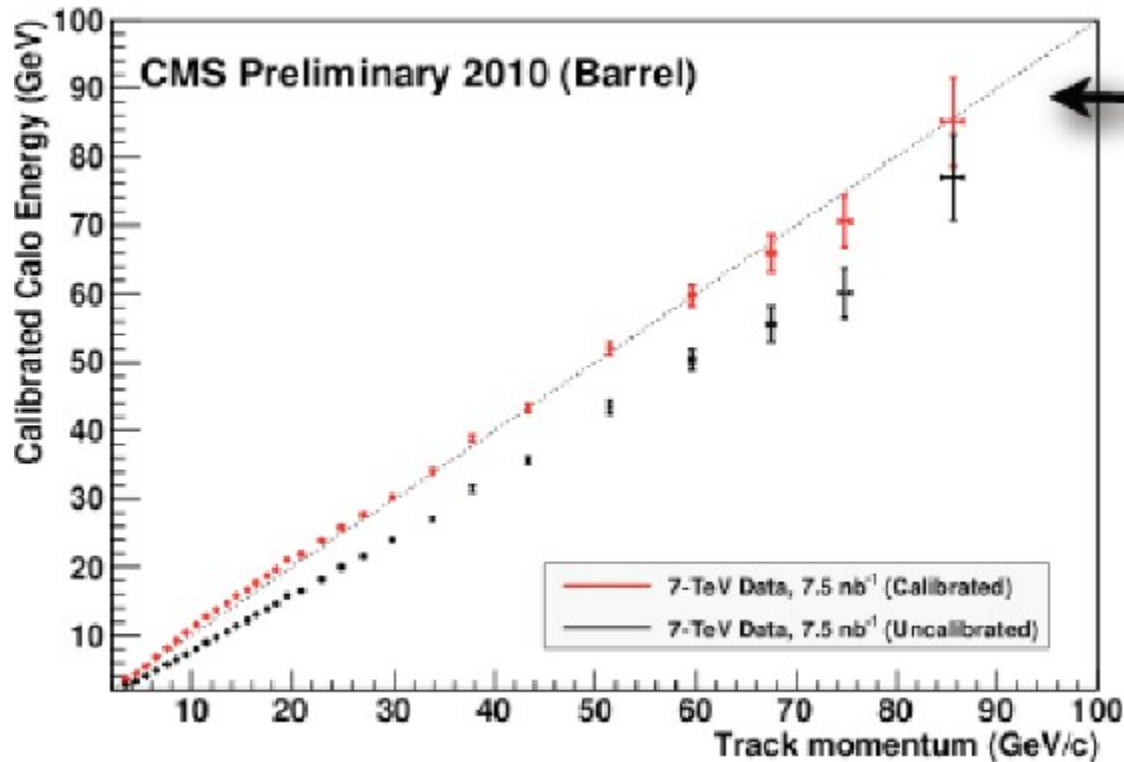
# ECAL calibration

Commissioning with  $\pi^0 \rightarrow \gamma\gamma$  in 2010



- Stable absolute ECAL calibration

# HCAL calibration



- Calorimeter response important for neutral hadrons
- Present calibrated response at the level of 2%

# linking and candidate identification

# Linking algorithm

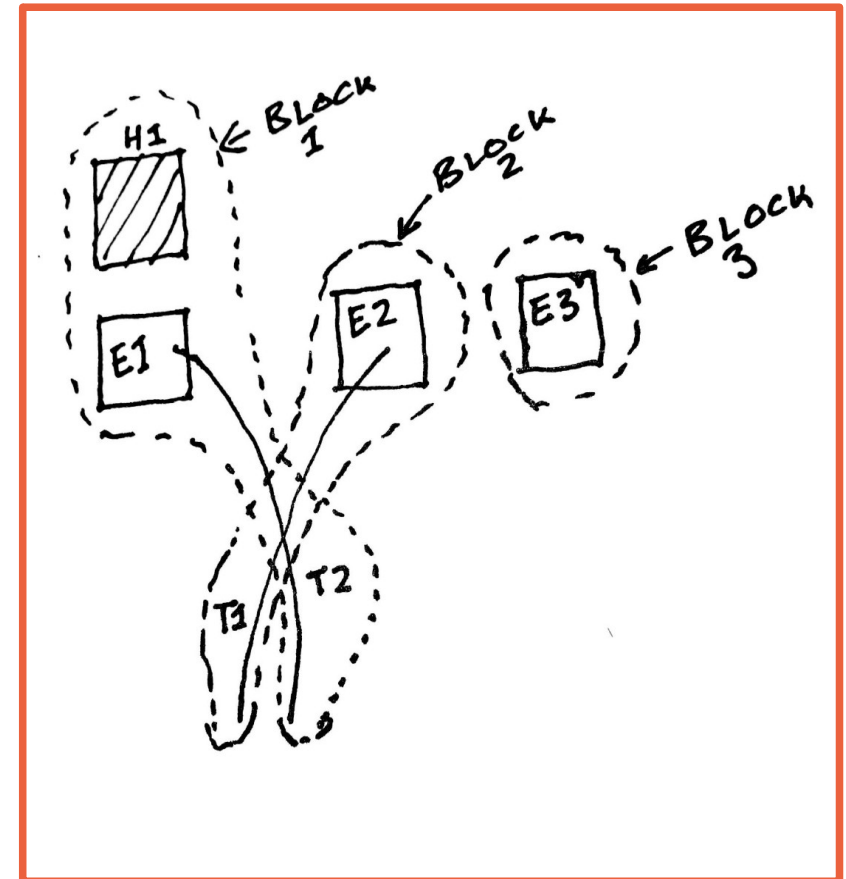
- Link elements to blocks
- Blocks = collection of elements linked directly or indirectly
- Purity of linking: all linked elements belongs to one particle
  - limited by granularity
- Efficiency of linking: probability to find all links due to a particle
  - limited by material present in front of a detector element
- Every pair is checked for link. Pair up pf elements based on proximity
- Grows quadratically with  $n$  (problem for high pileup, heavy ion)
- Dichotomic sorting with  $k$  dimensional tree for linear growth with  $n$

J. L. Bentley, "Multidimensional Binary Search Trees Used for Associative Searching",  
*Commun. ACM* 18 (September, 1975) 509–517, doi:10.1145/361002.361007.



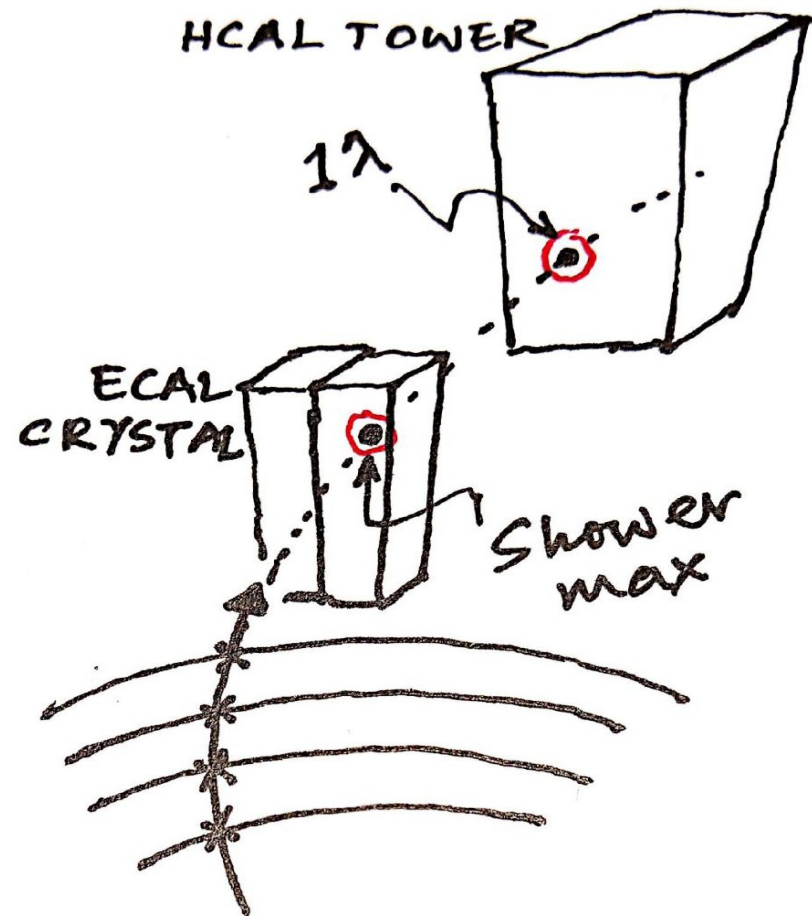
# Linking contd...

- After sorting the link algorithm produces blocks
- Blocks are typically upto 3 elements
- Smallness of the blocks ensures performance of algorithm independent of event complexity
- Jets much more complex than the simple example essentially has the same energy response



# Linking tracks to clusters

- A track is linked to a calorimeter or preshower as follows:
- From the last hit, extrapolate the track to the expected ECAL shower maximum of an electron
- To 1 interaction length depth in HCAL
- To the two layers of preshower
- Link if the extrapolated point falls within cluster area
- Link distance = distance in eta-phi between extrapolated track and cluster position

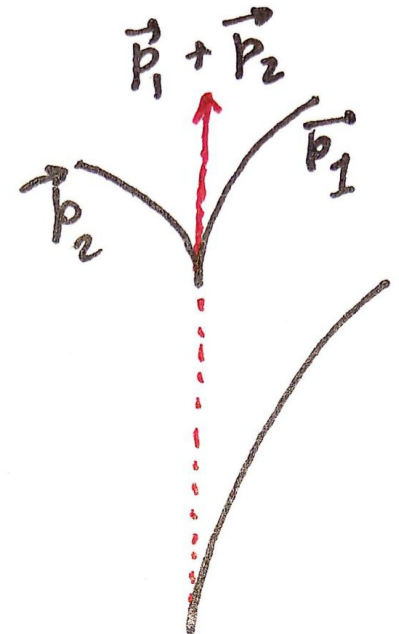
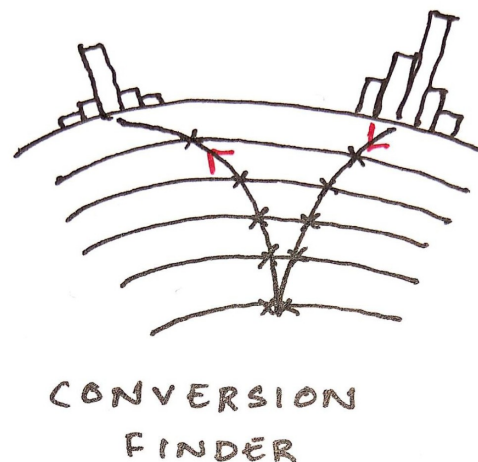
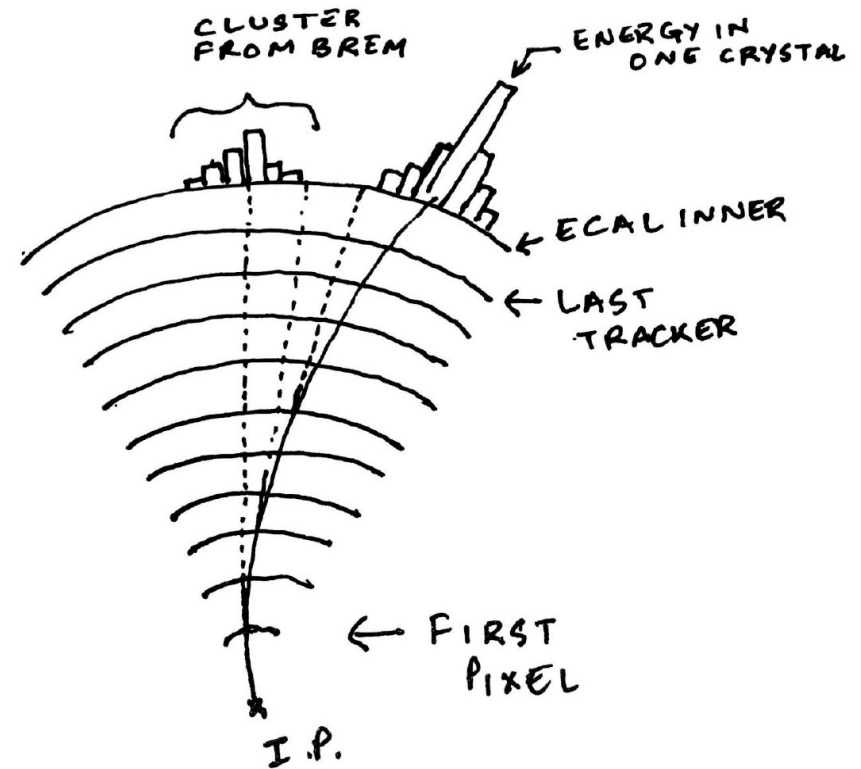


# Linking calorimeter clusters

- If the position of the higher granular calorimeter cluster falls inside the cluster area of lower granular calorimeter, link the two
- Multiple links – keep the one with shortest distance

# Linking: brem and conversion

- If extrapolated tangent to a track falls inside a ECAL cluster, link it.
- For conversion dedicated conversion track finder links track pairs compatible with a conversion
- If the resultant of two conversion tracks is tangent to another track then link



# Linking muon tracks and tracker tracks

- Nothing special is done in particle flow

# From blocks to candidates

- Linking produces blocks
- In each blocks candidates are searched in a sequence
- Identify muons and remove corresponding tracker tracks and HCAL, ECAL deposits
- Then electron and photons are identified and corresponding elements are removed
- Remaining elements are examined for charged hadrons, neutral hadrons and non-prompt photons from fragmentation and decays in jets

# Muon identification

- Sum of ET of calo deposits and pT of tracks in tracker in 0.3 isolation cone  $< 10\%$  pT of muon
  - Gives extremely high purity
- Care is needed for muons inside jets (heavy flavour decay)
  - Charged hadron track identified as muon will give spurious neutral hadron
  - Failing to remove muon track will tend to give spurious charged hadrons
  - tighter muon selection is applied (atleast three track segments, calo deposits compatible with muons)

# Electrons and photons

- Candidates are
  - GSF track with a cluster
  - Topological ECAL cluster
- All other clusters linked to the candidate by track tangent are added to the candidate
- All tracks linked to the candidate are added to the candidate
- Pions removed by (ECAL energy/track pT) and ECAL energy/HCAL energy)
- GSF electron candidates are then passed through a BDT with 14 inputs (track quality, radiated energy, energy to momentum ratio, HCAL deposit...)
- Clusters without GSF track are prompt photons if they have desired shower shape and are loosely isolated



# Hadrons and photons

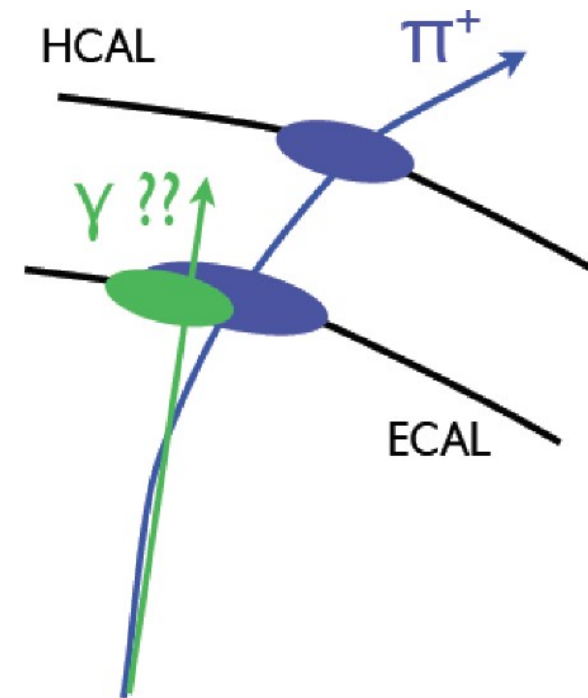
- Stable charged:  $K^{+-}$ ,  $\pi^{+-}$ , protons
- Stable neutrals: neutron,  $K_L^0$
- Photons from  $\pi^0$ 's, eta, fragmentation
- charged hadrons: require tracks to have  $p_T$  uncertainty smaller than the linked cluster energy uncertainty to control fakes at high  $p_T$
- 0.2% tracks are rejected of which 90% are indeed fakes, remaining 0.02% get reconstructed as photons or neutrals
- Hadron id starts from HCAL clusters linked to a track.
- In case of many clusters to one track, take the nearest.

# Charged Hadrons first

- Sum of track momenta,  $\text{sum}(p)$  is compared to sum of calibrated ECAL + HCAL (E+H) energies.
- True energy for calibration:  $E+H > \text{sum}(p)$ ?  $(E+H) : \text{sum}(p)$
- if  $E+H \ll \text{sum}(p)$  use a fake track removal procedure
  - 0.03% of tracks affected
- Remaining tracks are charged hadrons.  $p$  is taken from track and then recomputed as a weighted sum of calo energy and track  $p$

# Then photons and neutrals

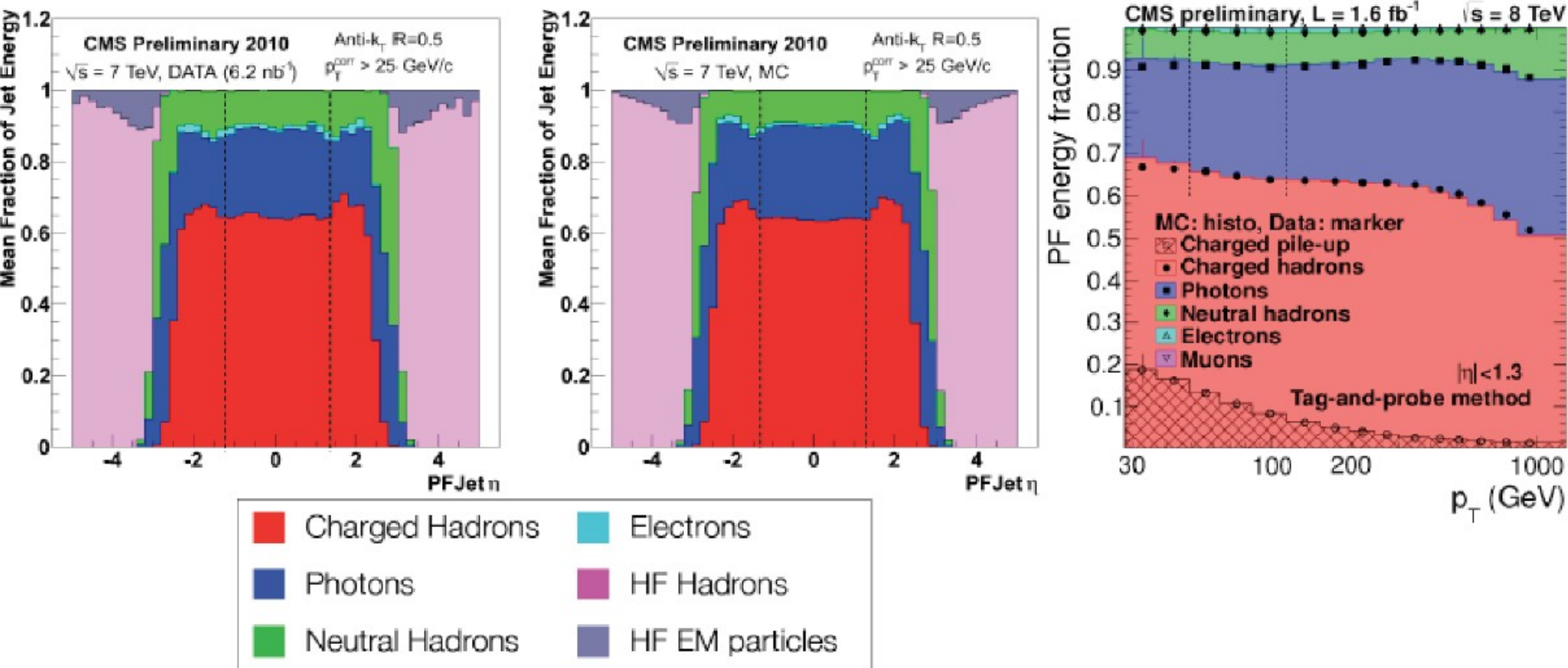
- If  $E+H \gg \text{sum}(p)$  assume due to photons and neutrals
- Start with photons (25% of jet energy in ECAL vs 3% by neutral hadron)
- If  $((E+H) - \text{sum}(p) \leq E)$  create photon
- Else create a photon from  $E$  and a neutral from remaining excess.
- Remaining ECAL elements are photons and HCAL elements neutral hadrs. (within tracker coverage)
- Beyond tracker coverage ECAL cluster linked to a HCAL cluster treated as hadron and only ECAL cluster as photon



# Performance of particle flow

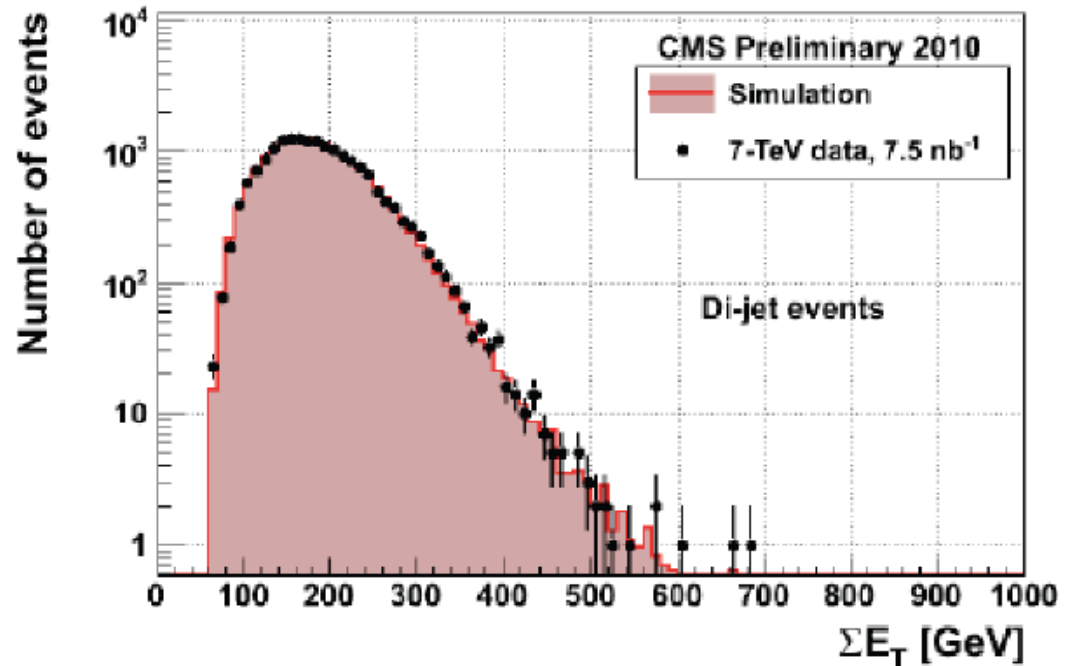
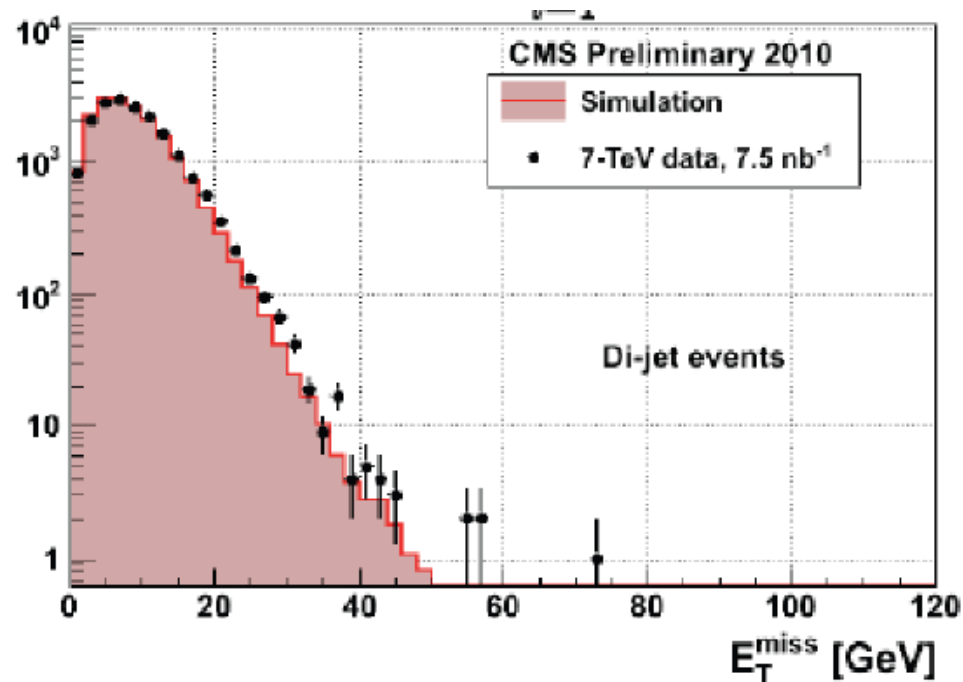
taken from 2016 slides of  
Albert de Roeck

# Jet composition



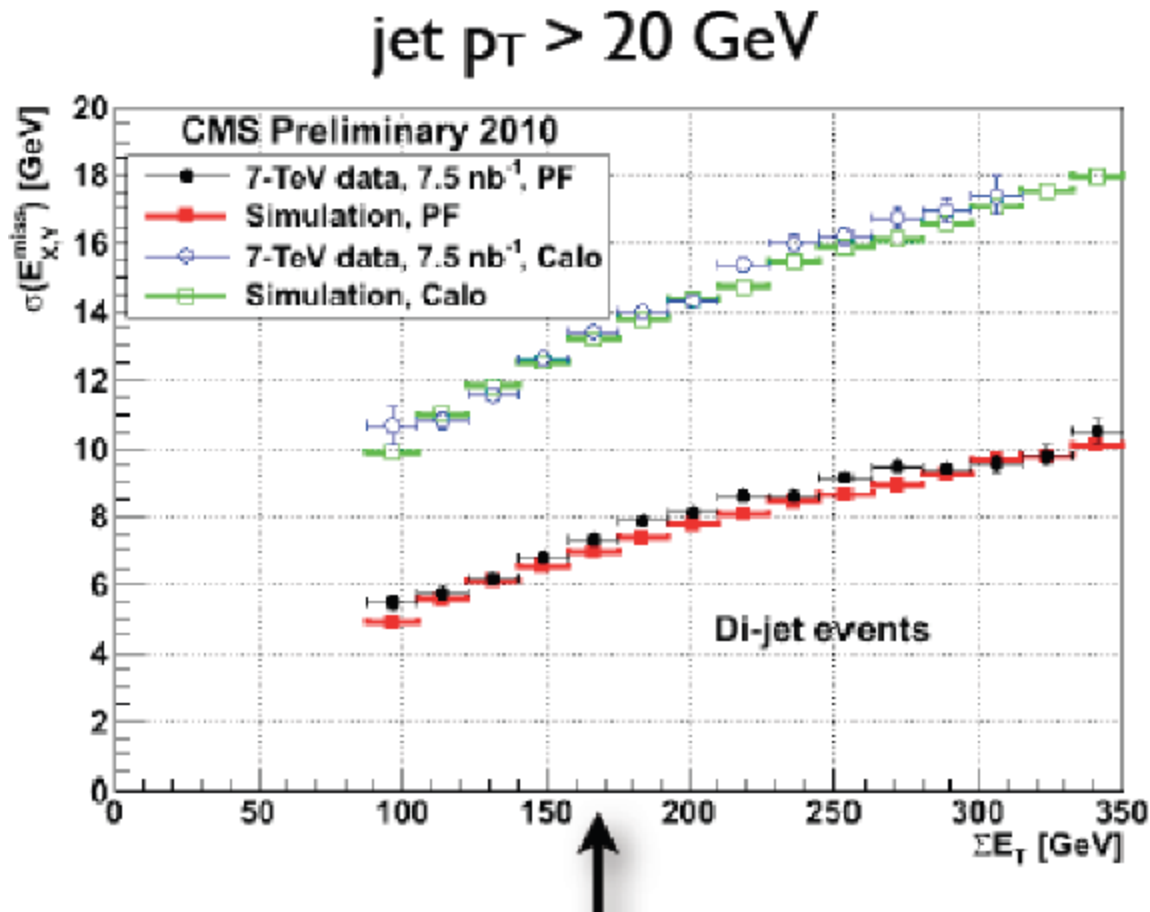
The agreement of the first days is confirmed with high statistics, even in presence of pile-up

# MET



- Agreement over 3 orders of magnitude in scalar and vector sums of PF candidate momenta

# MET improvement



- Improvement by a factor 2!

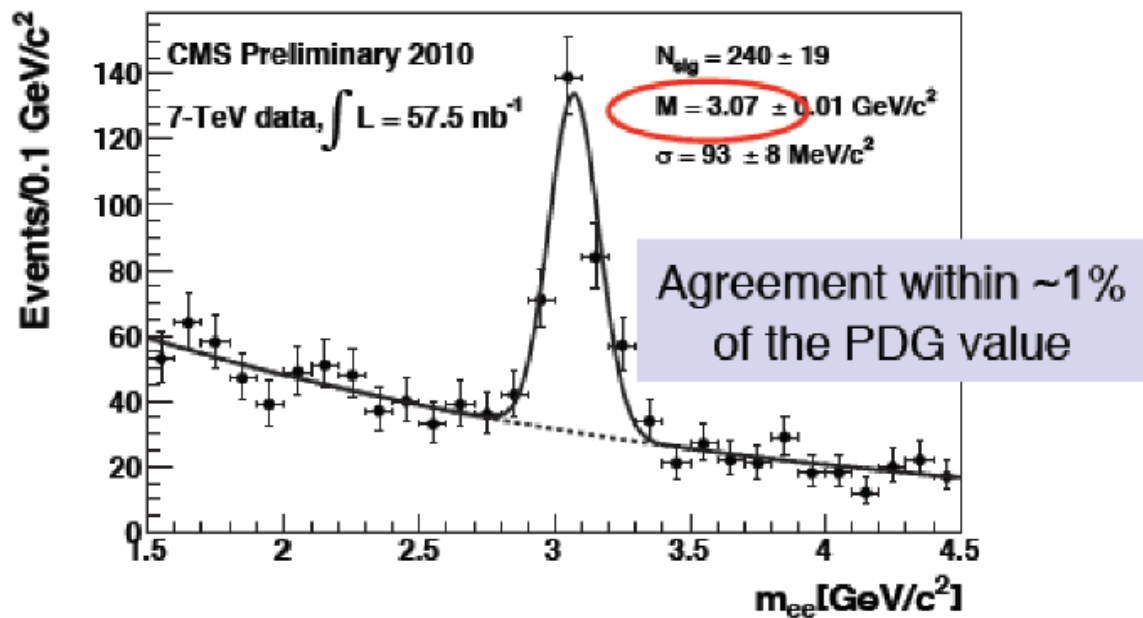
# Photons and electrons

From 2010 ....

to

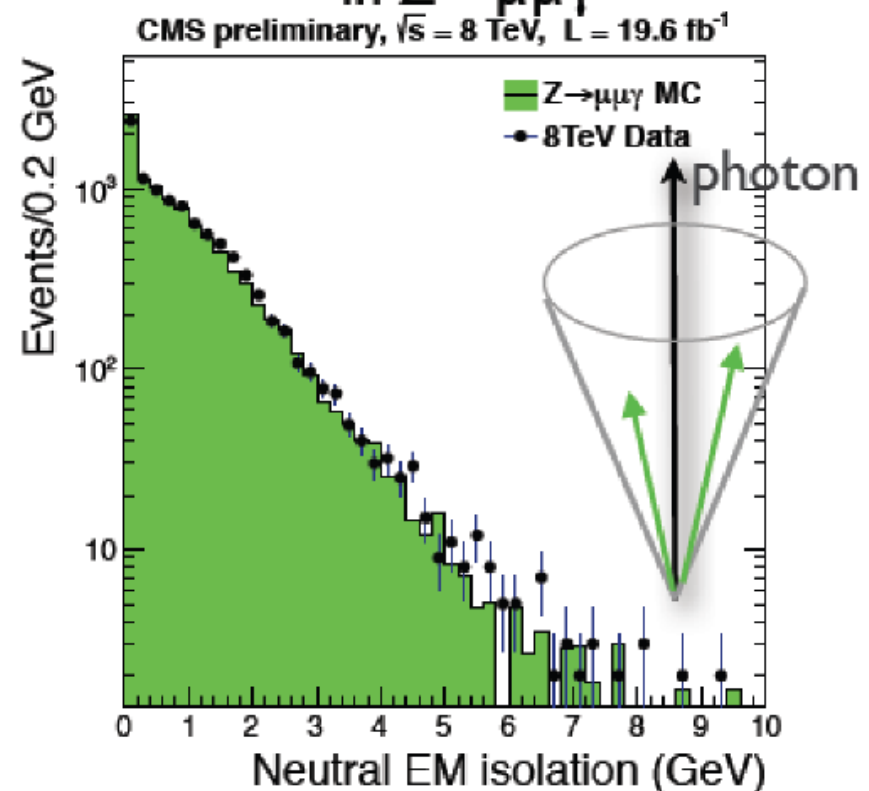
...2013

$J/\Psi \rightarrow ee$



With a simple selection a nice  $J/\Psi \rightarrow ee$  peak is obtained

Photon isolation around photons  
in  $Z \rightarrow \mu\mu\gamma$





# Effect on physics

## Jets

- energy resolution / 2
- angular resolution / 3
- Flavour dependence of response / 3
- Systematic error on JES / 2
- « electron in jet » b tagging
- quark-gluon jet tagging

## MET

- resolution / 2
- less tails

## $\tau$

- jet fake rate / 3 @ same eff.
- energy resolution / 4
- decay mode

## Electrons

- down to  $p_T = 3$  GeV
- in jets

## $\mu$

- 4% more efficient ID @ same bkg rate
- better momentum assignment at high  $p_T$

## e, $\mu$ , $\tau$ , $\gamma$ isolation

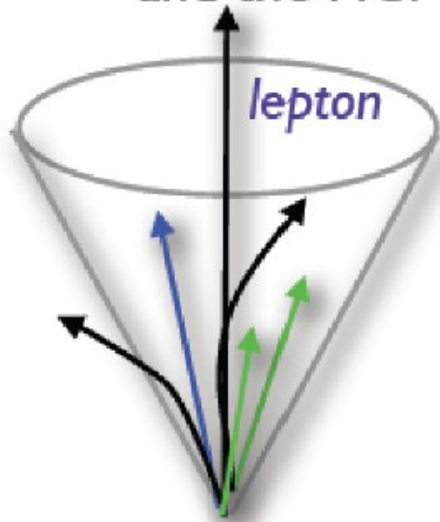
- improved performance, pile-up control

## Physics analyses

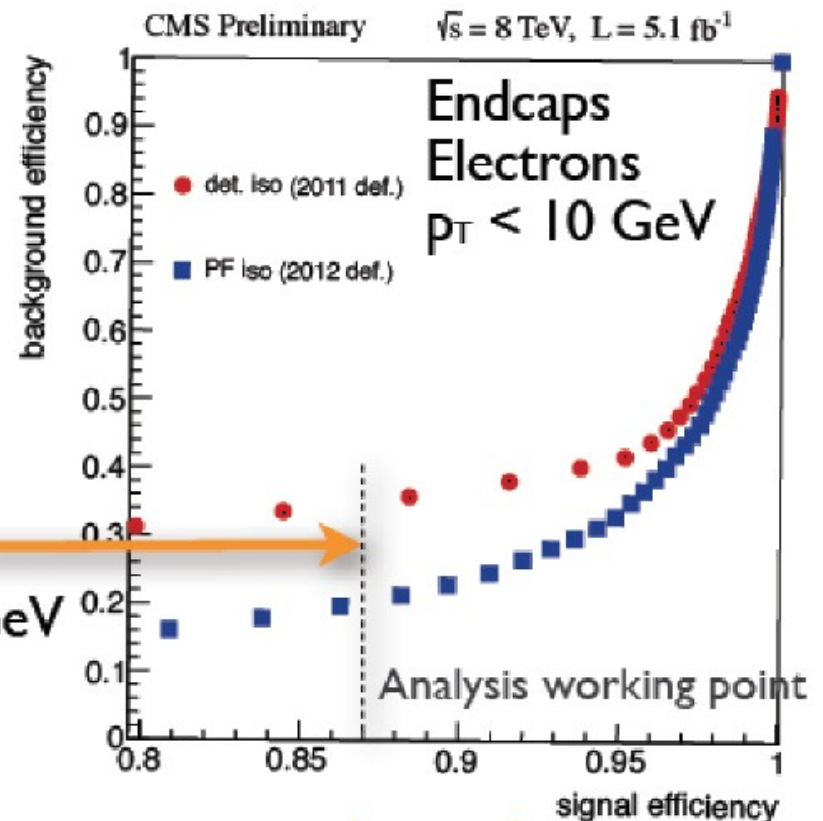
- Better trigger for jets, MET, taus (PF@HLT)
- FSR photon recovery in HZZ
- embedding in  $H \rightarrow \tau\tau$
- jet substructure

# PF isolation

The “**classic**” method to compute the lepton/photon isolation was to sum the energy deposits in the tracker, the ECAL and the HCAL



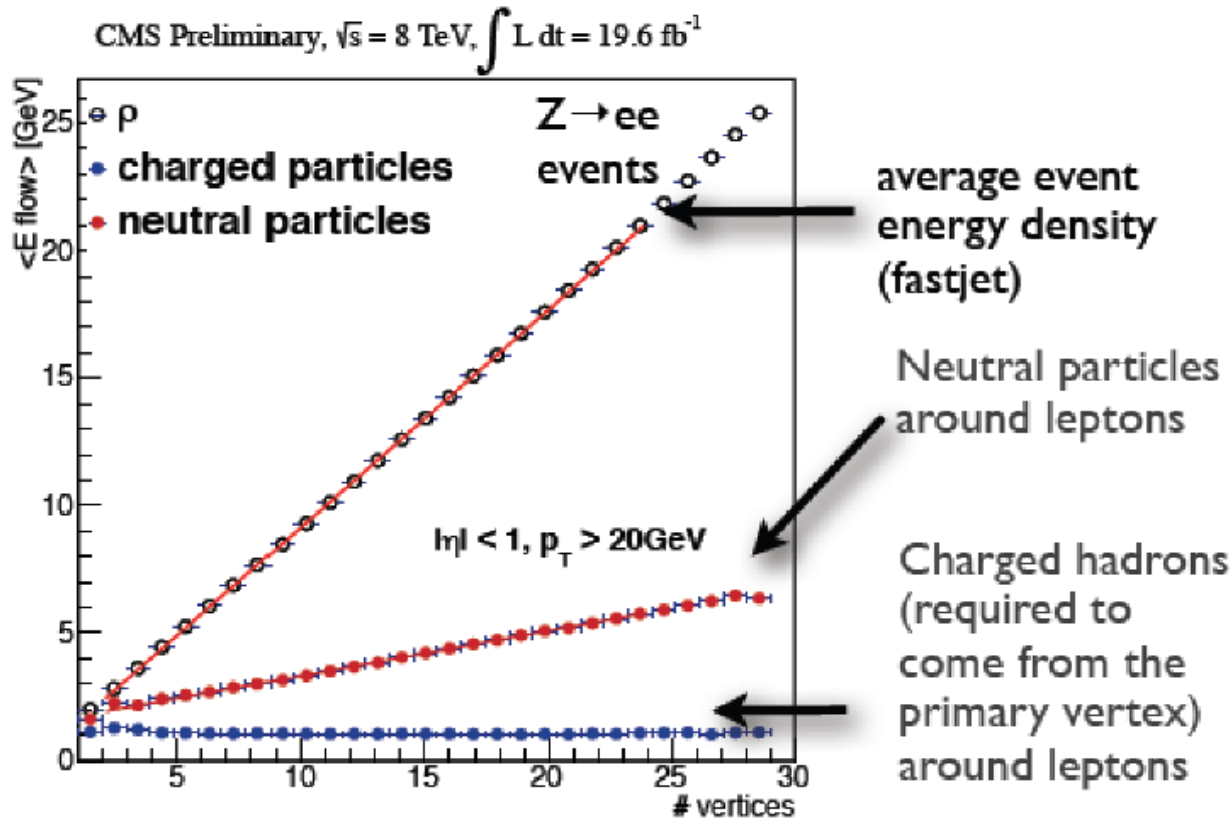
Background efficiency  
divided by a factor of 2  
Similar gain for  $p_T < 20$  GeV



With the Particle Flow it is natural to use the **reconstructed particles**, to compute the momentum carried by charged hadrons/**photons**/neutral hadrons in a cone centered on the lepton/photon

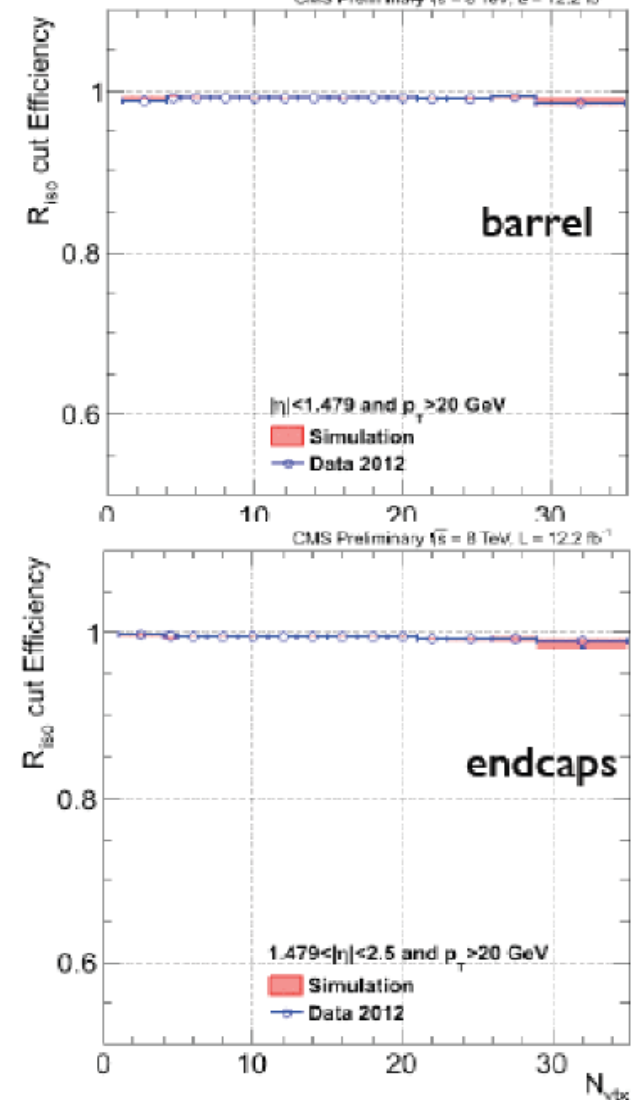
- The object footprint is automatically removed by the PF
- No double counting of track and calorimeter energy deposits for charged particles

# Isolation and pileup mitigation



- No correction needed for the **charged hadrons** (vertex constraint)
- For the **neutrals**: the PU contribution in the cone is estimated (proportional to the energy density) and subtracted

Isolation efficiency measurement with  $Z \rightarrow ee$  tag and probe



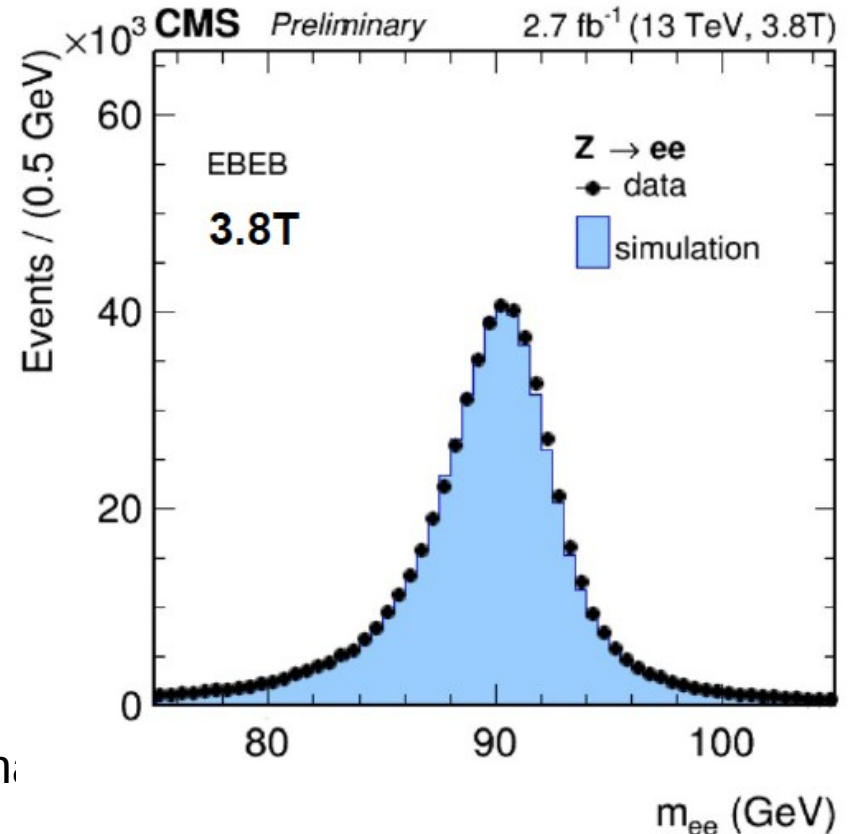
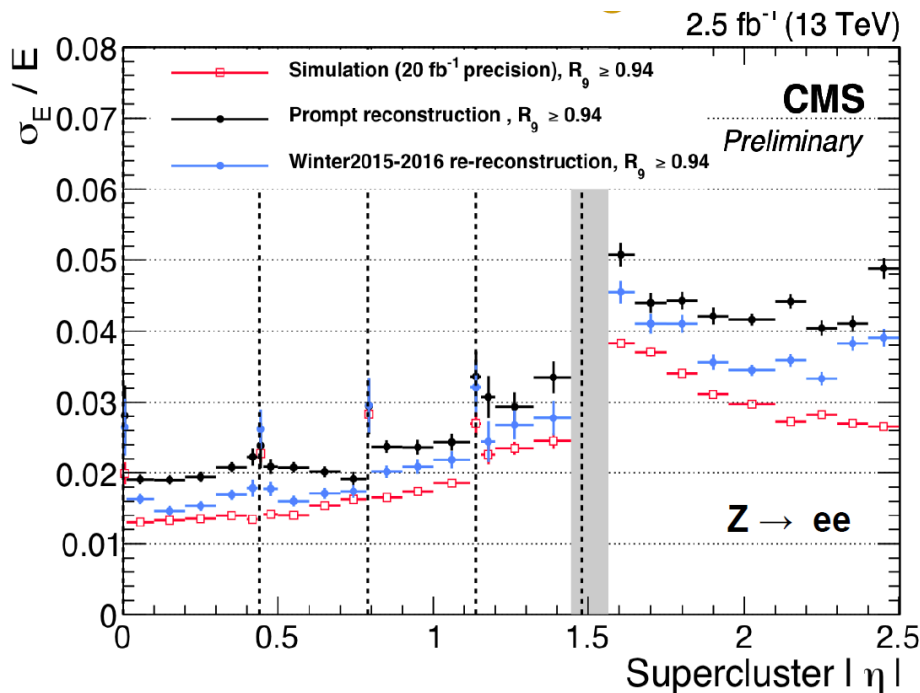
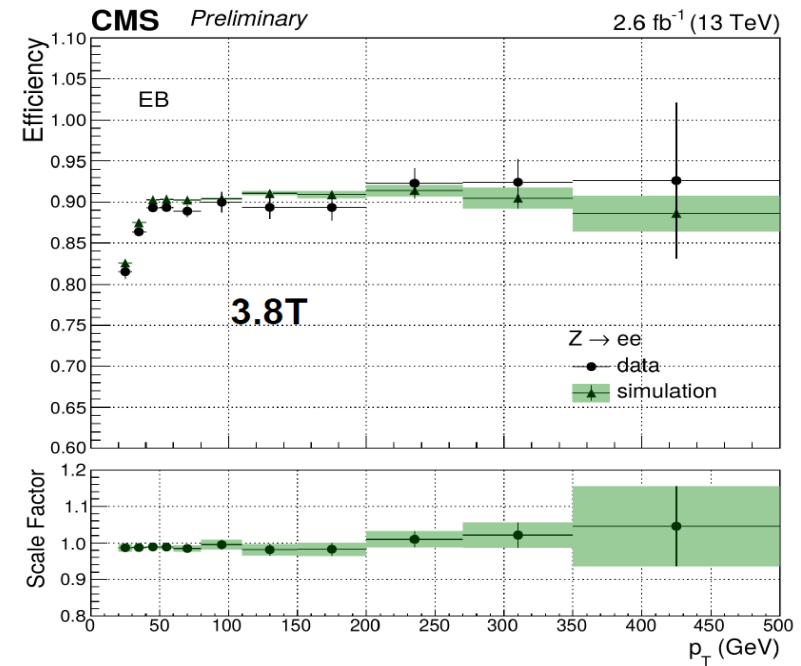
# Summary

- Algorithm established to be working in CMS
- Exploits power of granularity of the CMS detector
- Implemented and commissioned in run 1
- Significant improvements in jets, MET, tau, lepton isolation
- Most analyses use PF objects
- Some triggers also use PF
- Not only withstands pile-up, it is the way forward to maintain same performance in coming runs and for HL-LHC

# backup

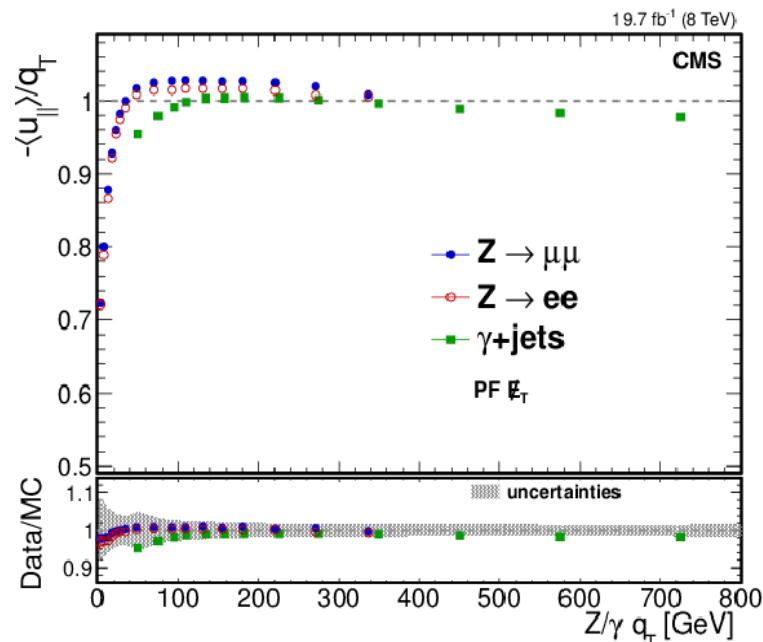
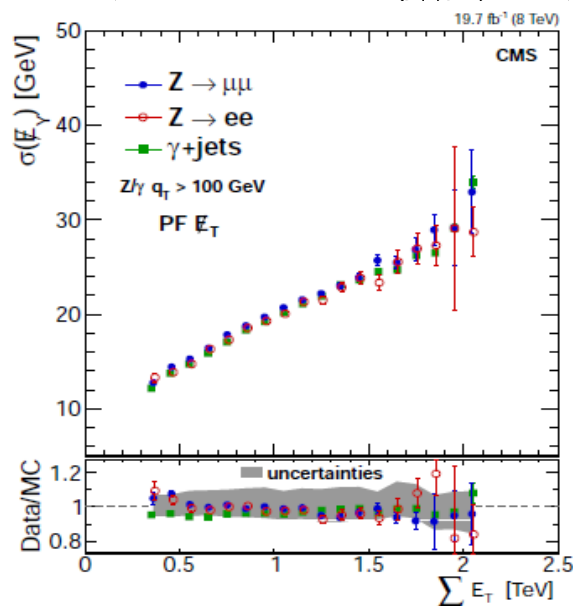
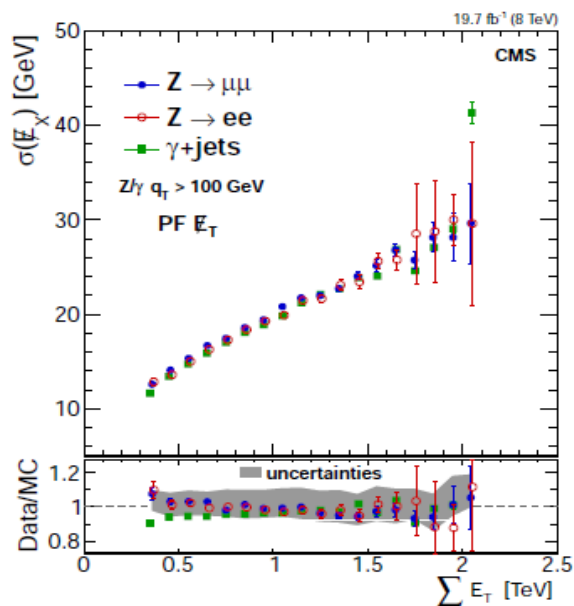
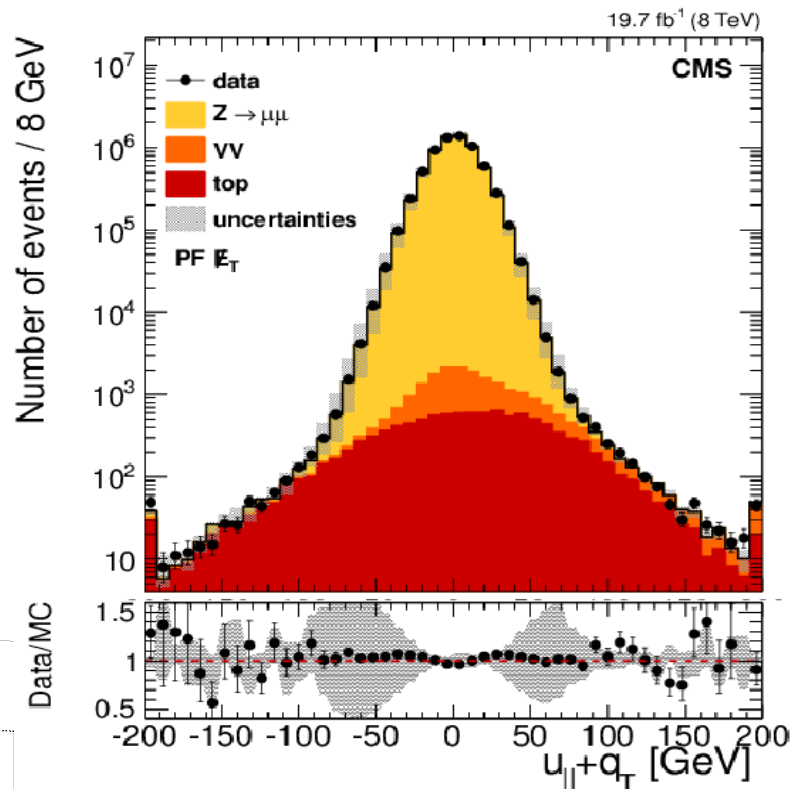
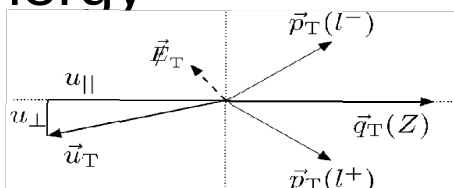
# Electrons and photons

- Photon identification efficiency  $\sim 90\%$
- Photon energy resolution  $\sim 1\%$  from Z to ee data



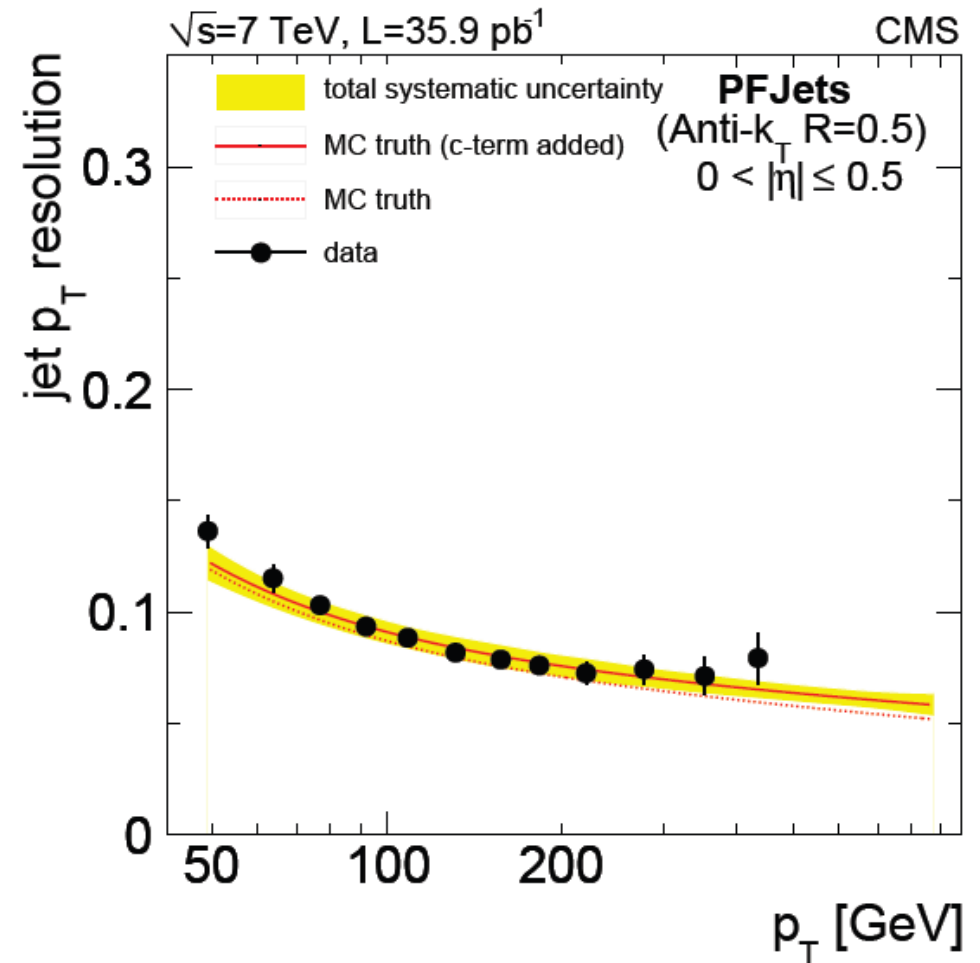
# MET ( $\cancel{E}_T$ )

- Constructed from PF candidates
- Corrected for various detector effects
- Dominated by jet energy resolution



# Jets

- ▶ Anti-KT with distance parameter 0.5
- ▶ CALO, JPT, PF
- ▶ PF jets clustered from PF candidate particles
- ▶ Resolution measured from MC and various energy balancing methods

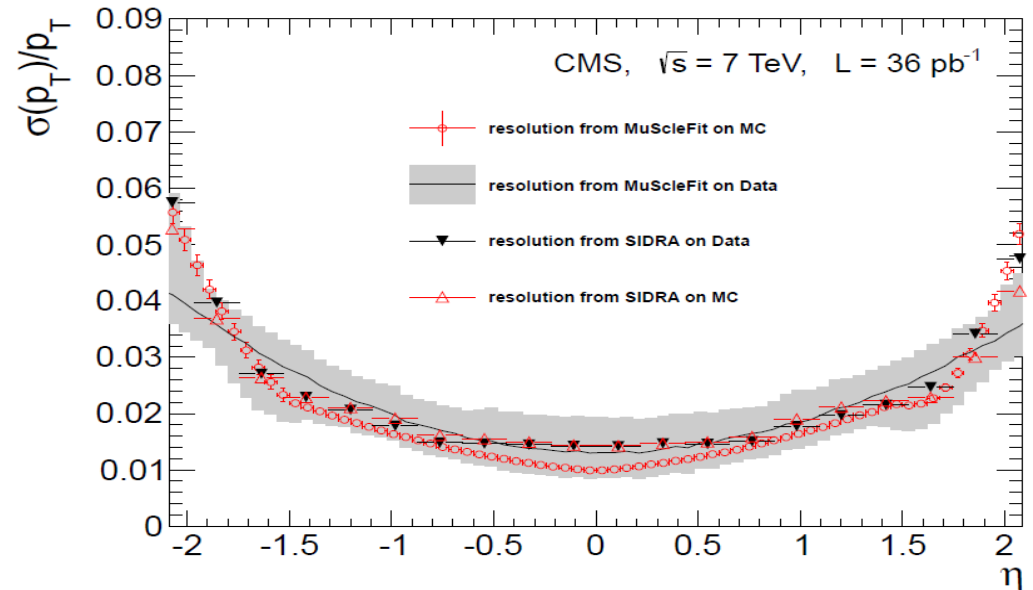


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# Muons

- ▶ 1-6% relative momentum resolution for  $p_T < 100 \text{ GeV}$
- ▶  $> 10\%$  at a TeV
- ▶  $> 1\%$  hadron to muon fake probability
- ▶ Single muon trigger rates (much) better than 90% above a few GeV



# taus: the HPS algorithm

▶ charged hadrons reconstructed using PF algorithm

▶  $\pi^0$ 's are reconstructed in ECAL as strips

▶ Strips:

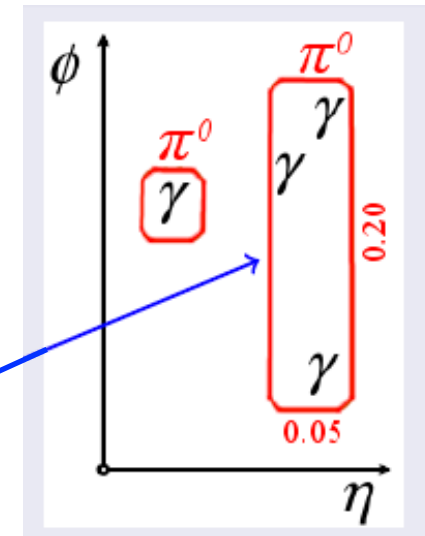
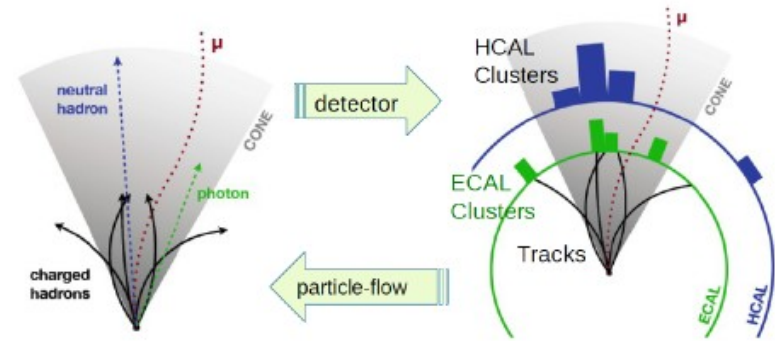
▶  $\pi^0 \rightarrow \gamma\gamma$

▶ Photon conversion in the tracker material

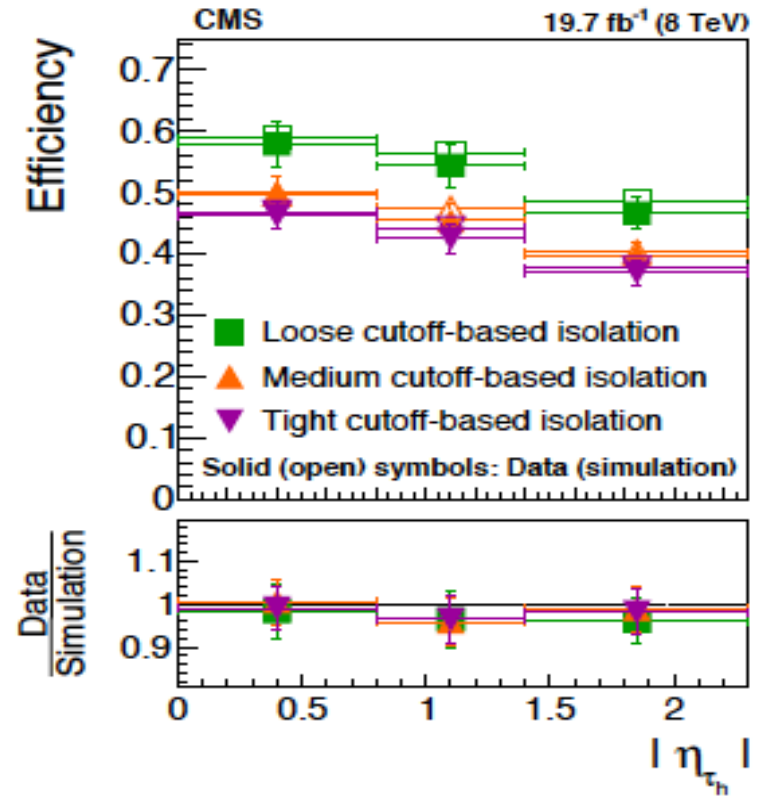
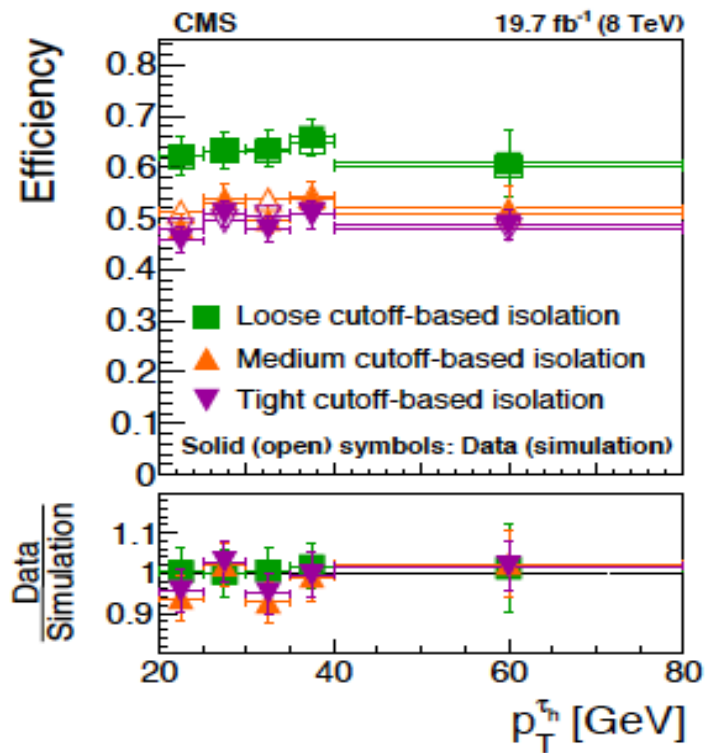
▶ electron tracks bending in the magnetic field: broadening of the signal in the azimuthal direction

▶ A strip of 0.05 in  $\eta$  and 0.2 in  $\phi$  is built

▶ Mass is required to be consistent with  $\pi^0$



# Tau efficiency



# b-tagging efficiency

- The impact parameter (IP) of the track wrt the primary vertex is used to distinguish the decay product of the b hadron from the prompt tracks
- Algorithms:
  - Track counting: sorts tracks in a jet by decreasing value of IP significance
  - Jet probability (JP): uses estimate of the likelihood that all the tracks associated to the jet come from primary vertex
  - Jet B probability (JBP): same as JP, in addition, it gives more weight to the tracks with high IP significance

