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Simulated Performance of the SiD Digital ECal Based on Monolithic Active Pixel Sensors

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on behalf of
the SiD MAPS Collaboration
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"The SiD Digital ECal Based on Monolithic Active Pixel Sensors",
10.3390/instruments6040051, Instruments, 6, 51 (2022)

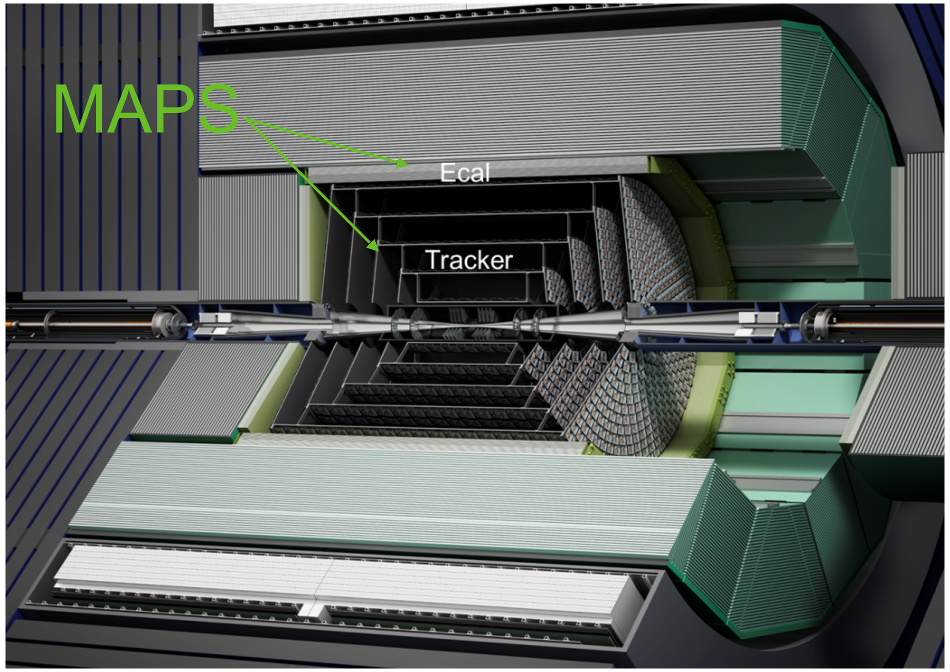
SiD Digital ECal Based on MAPS

- Upgrade ILC TDR design to replace sensors with 13 mm^2 analog pixels with 25 x 100 um^2 (or 25 x 50 um^2) digital pixels.
- How well can we measure energy and shower structure with digital system:
  - Compared to SiD baseline of analog measurements.
  - Can the detailed structural measurements be used to improve measurement?
  - Would a neural net optimization offer an improvement?
- What are the limits of transverse separation and measurement?

Large area MAPS for SiD tracker & ECal

Benefits of large-area MAPS:

- Standard CMOS foundry, low resistivity: **cost ⇩**
- Sensing element and readout electronics on same die
  - In-pixel amplification: **noise ⇩, power ⇩**
  - No need for bump-bonding: **cost ⇩**
- Area > 10x10 cm^2 → enable O(1) m^2 modules



An example of the SiD Tracker and the ECal overall design

Several design challenges:

- Large on-die variations, mismatch
- Yield
- Stitching layout rules
- Distribution of power supply
- Distribution of global control signals/references

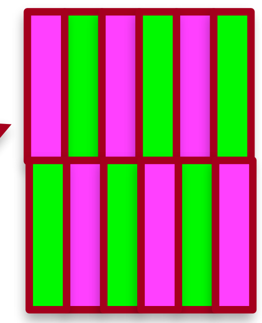
Goals of R&D: find solutions and explore novel design techniques

Main specifications for Large Area MAPS development

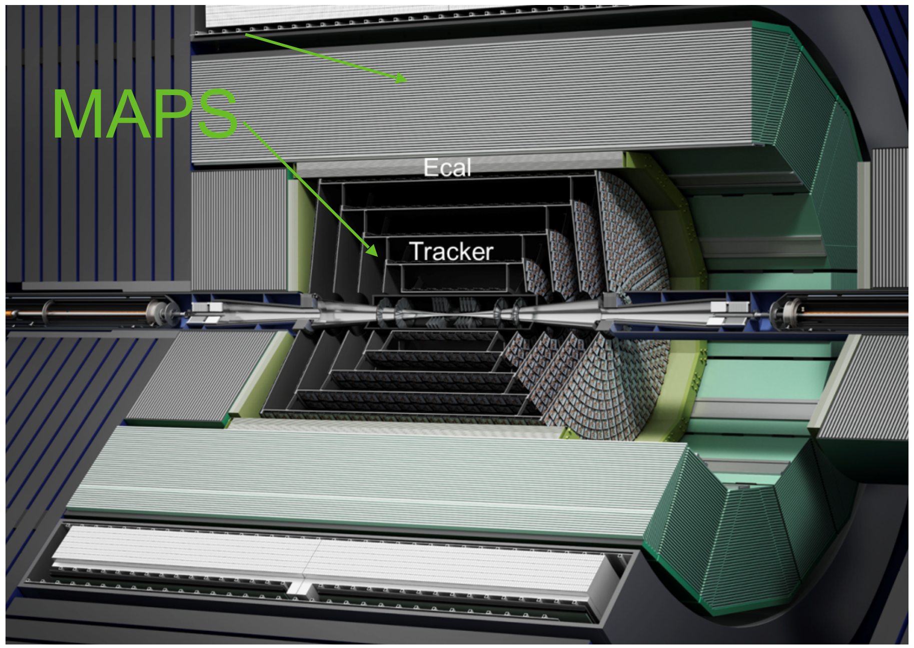
TID-AIR SLAC

L. Rota

Parameter	Value	Notes
Min Threshold	140 e^-	0.25*MIP with 10 µm thick epi layer
Spatial resolution	7 µm	In bend plane, based on SiD tracker specs
Pixel size	25 x 100 μm^2	Optimized for tracking (note: 25 x 50 μm^2)
Chip size	10 x 10 cm^2	Requires stitching on 4 sides
Chip thickness	300 µm	<200 µm for tracker. Could be 300 µm for EMCal to improve yield.
Timing resolution (pixel)	~ ns	Bunch spacing: C^3 strictest with 5.3->3.5 ns; ILC is 554 ns
Total Ionizing Dose	100 kRads	Total lifetime dose, not a concern
Hit density / train	1000 hits / cm^2	
Hits spatial distribution	Clusters	Due to jets
Balcony size	1 mm	Only on one side, where wire-bonding pads will be located.
Power density	20 mW / cm^2	Based on SiD tracker power consumption: 400W over 67m^2



25 x 100 μm^2 ECal performance same as 50 x 50 μm^2



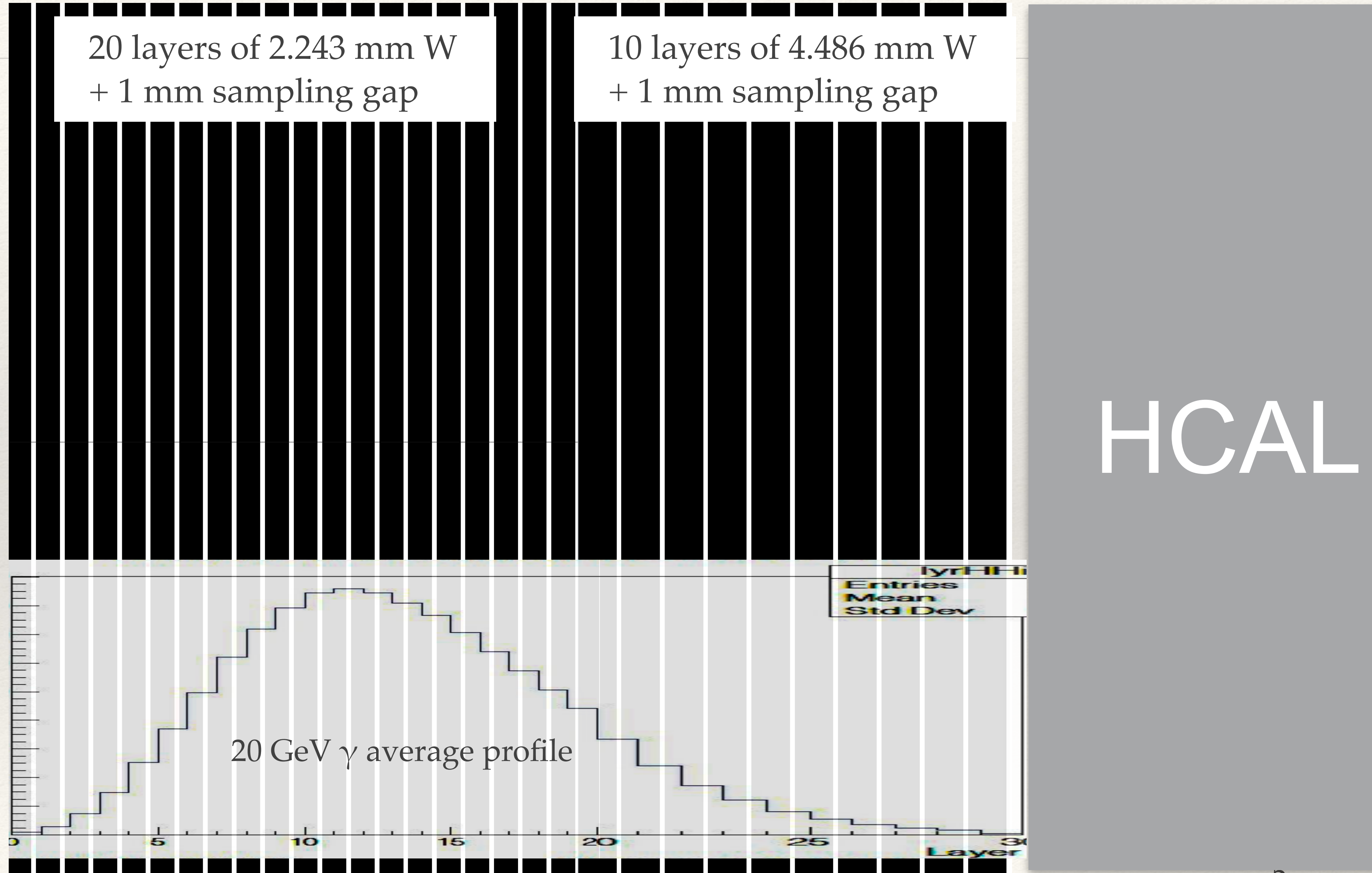
SiD Tracker and the ECal

RDC3 talks today
A. Habib & C. Vernieri

Model of longitudinal structure of SiD ECal

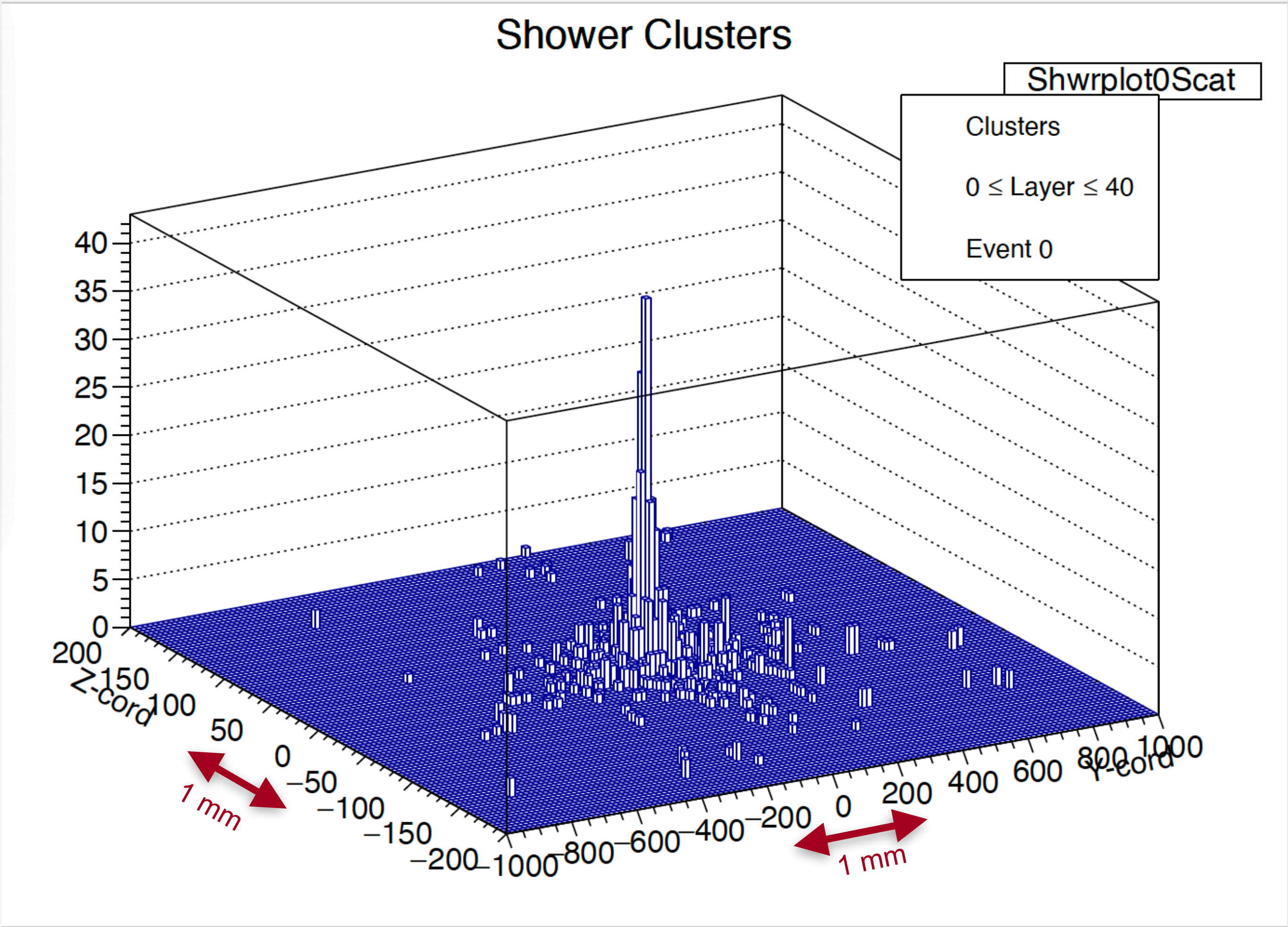
Total = 27 X_O

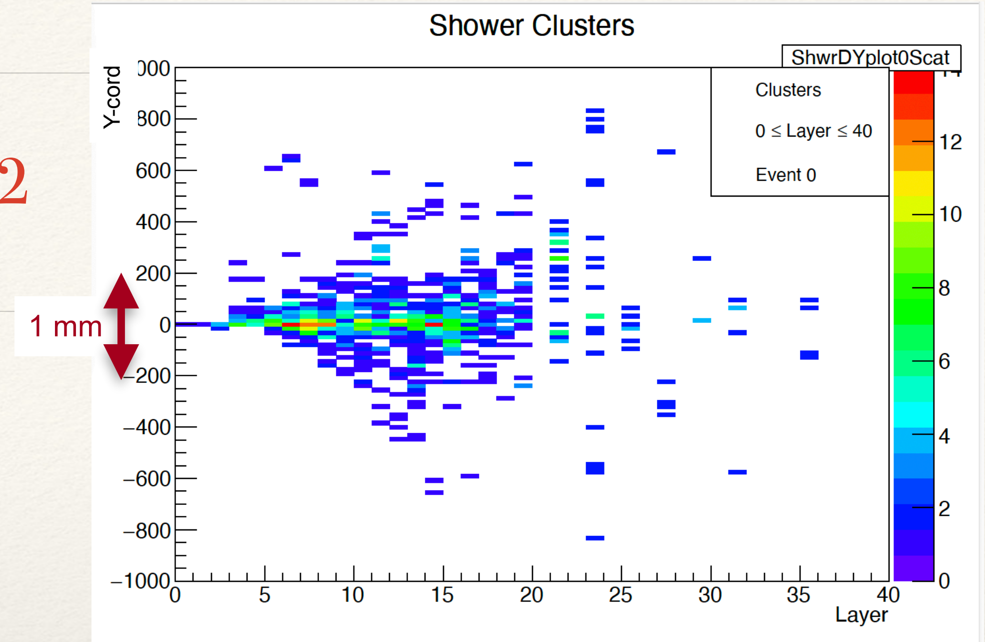
Incident Particle

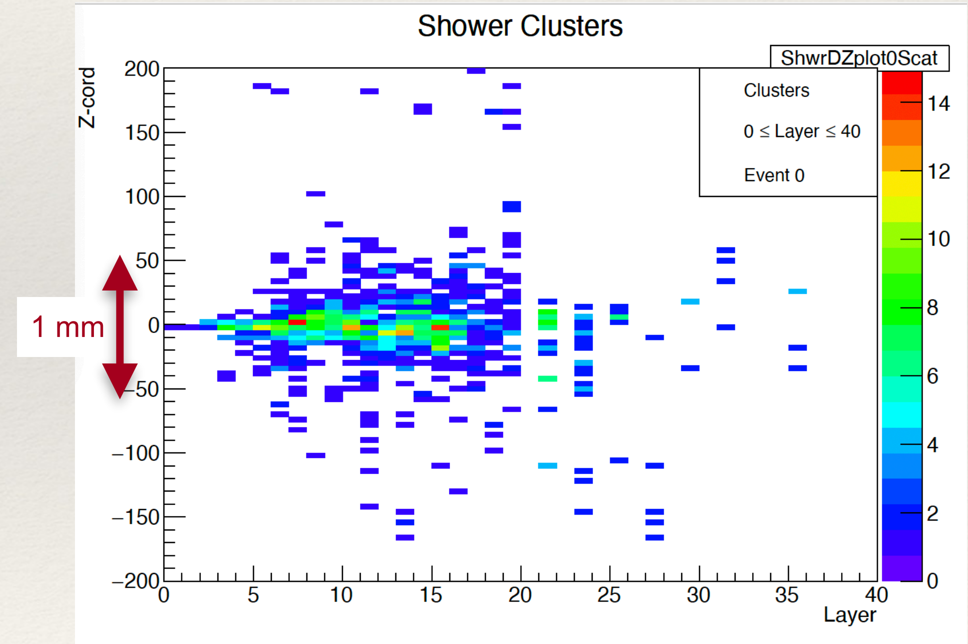


Minimize sampling gap to achieve optimal Moliere radius (14 mm) & shower separation

10 GeV Shower in 25 x 100 μm²

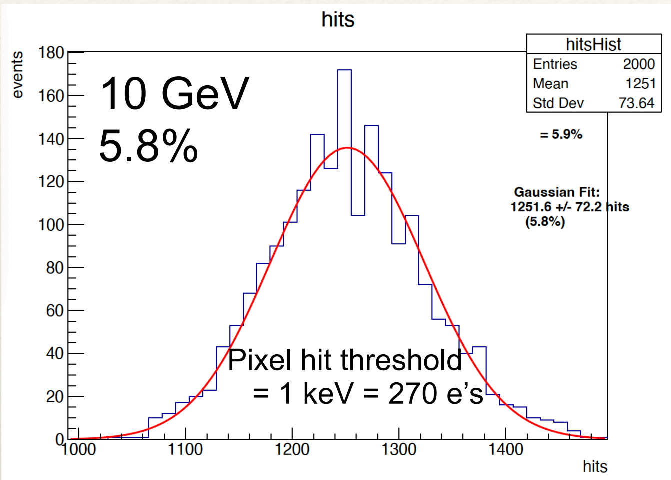


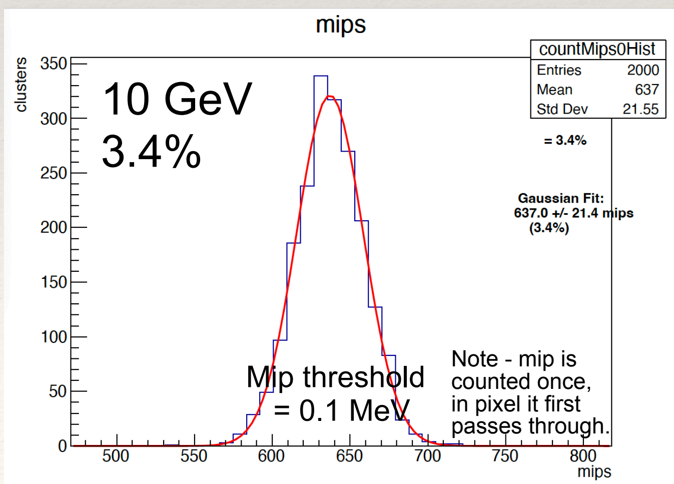


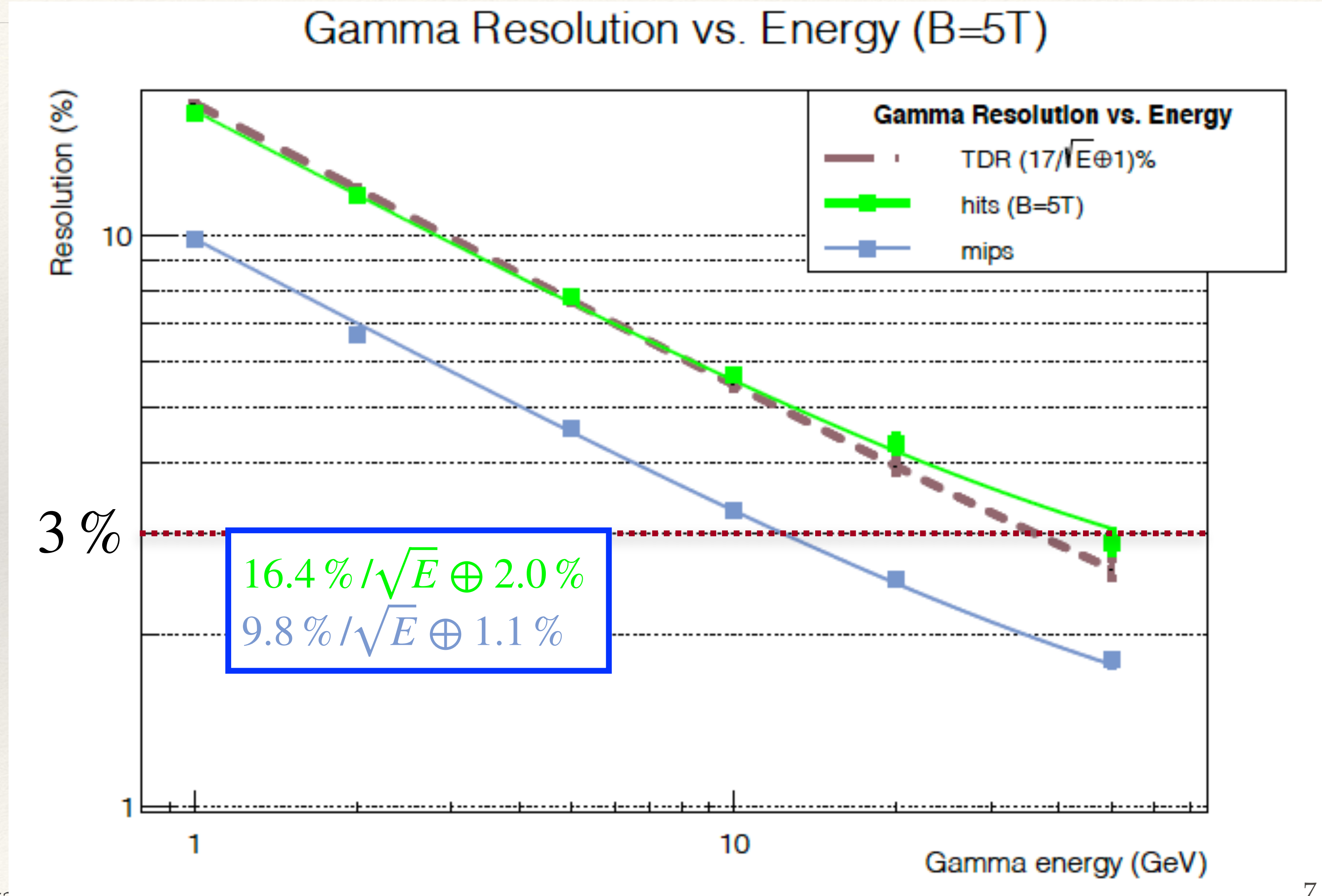


Resolution vs. Energy (hits & mips)

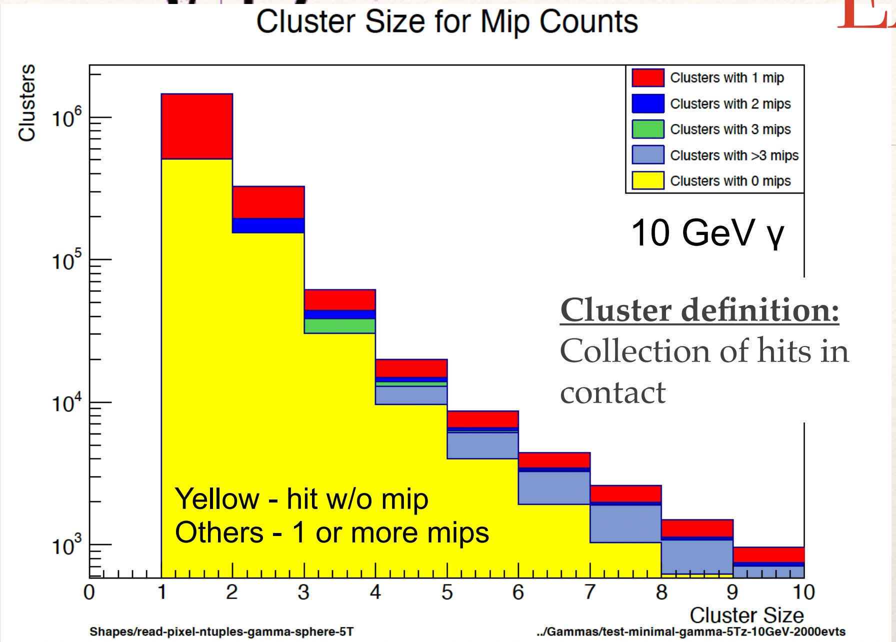
Resolution vs. Energy (hits & mips)



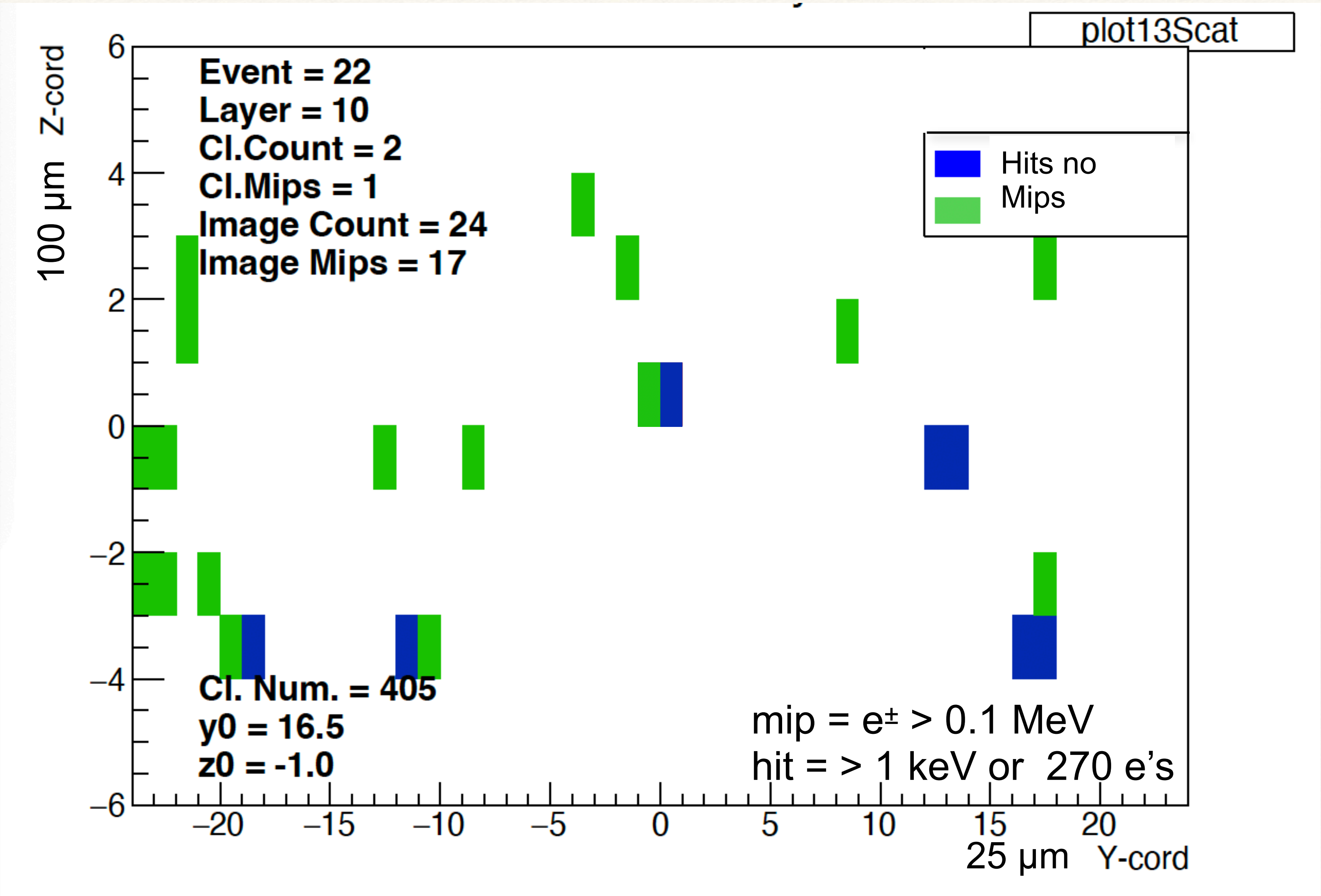




Example of hit distribution in a MAPS



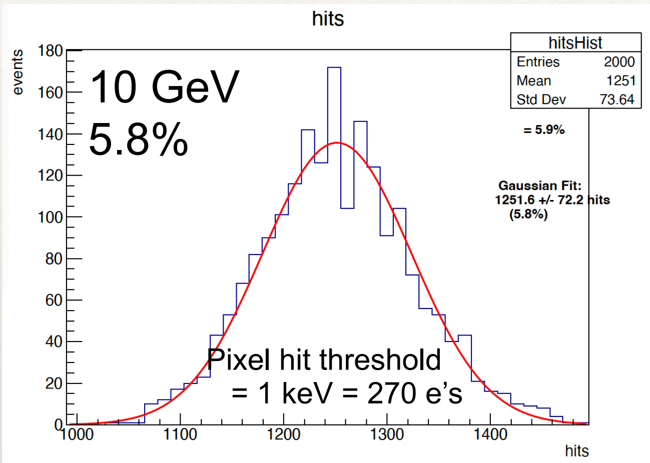
Cluster definition:
Collection of hits in contact

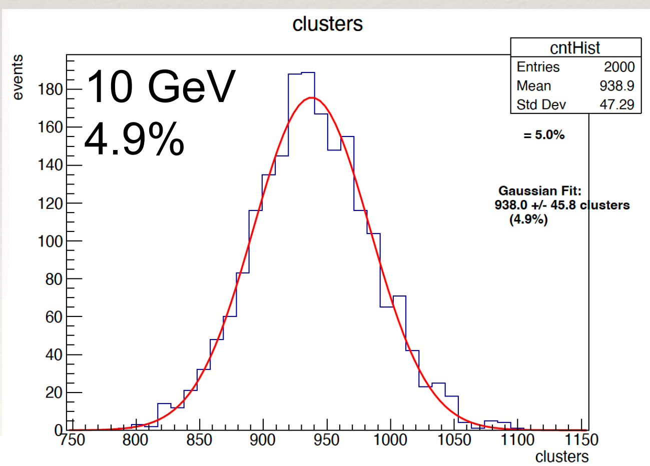


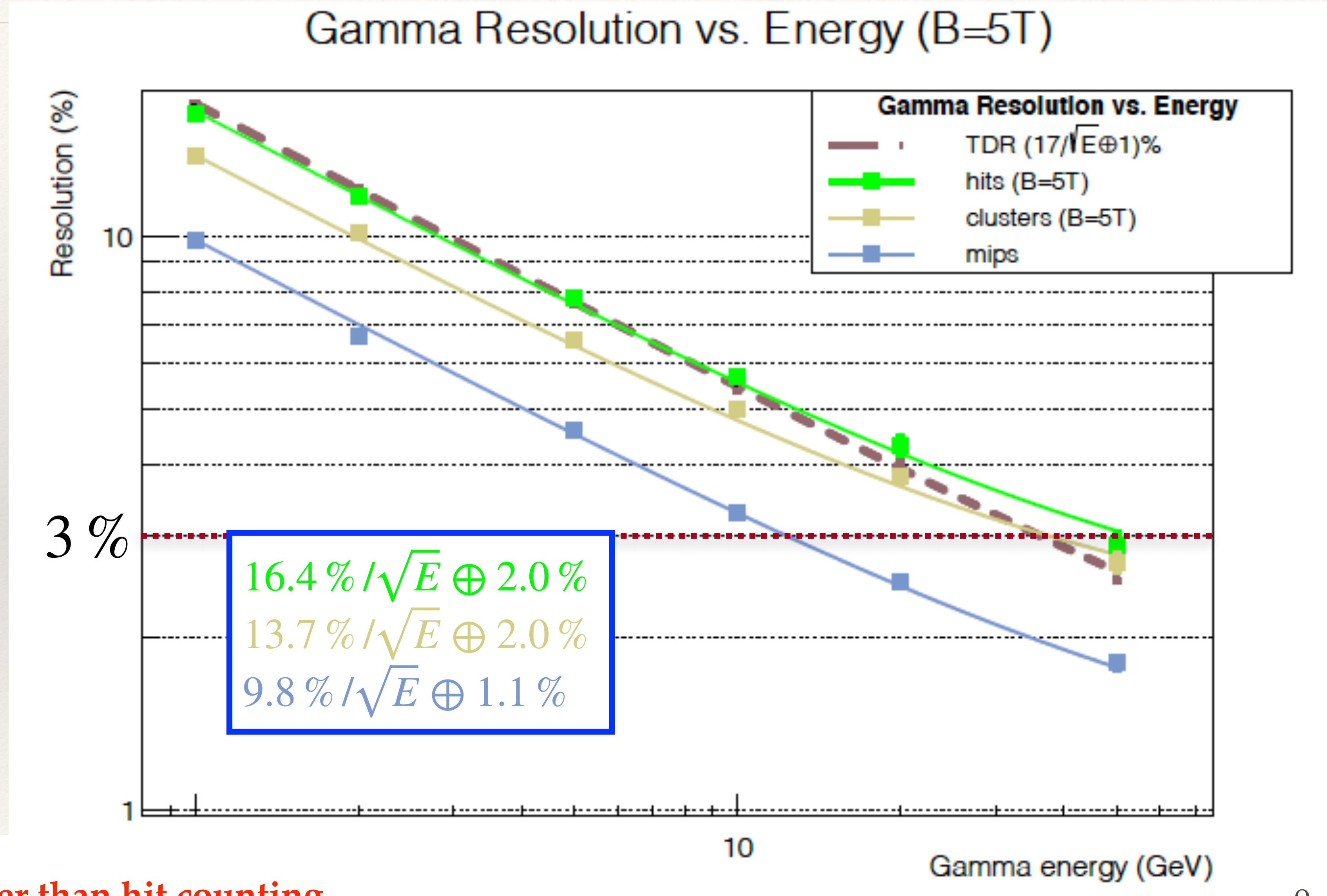
- Most hits isolated
  - Single hit cluster
- Multiple hit clusters
  - Often single mip,
  - Or no mip
- Counting clusters should reduce hit fluctuations

Resolution vs. Energy (hits/clusters/mips)

Resolution vs. Energy (hits/clusters/mips)

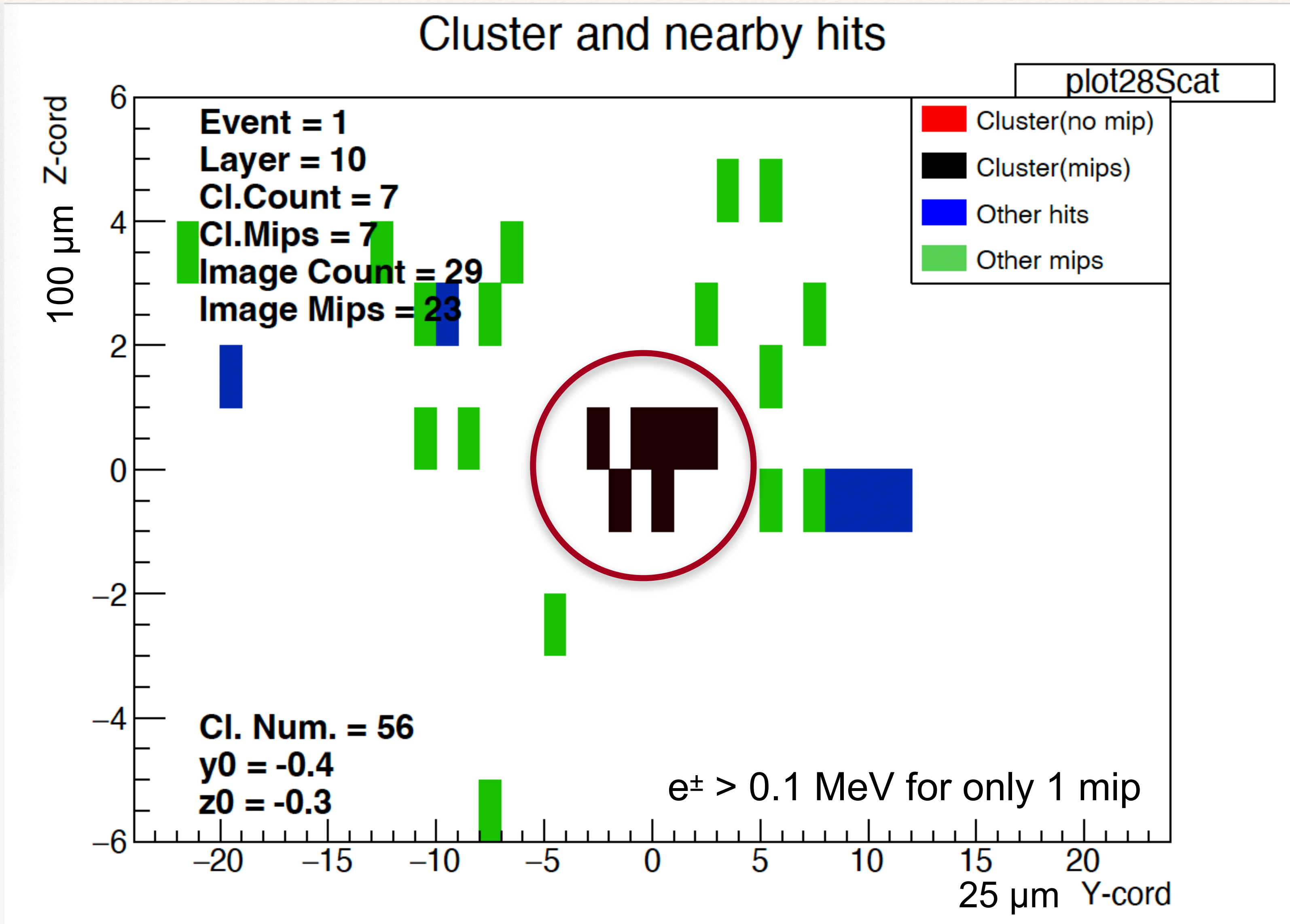




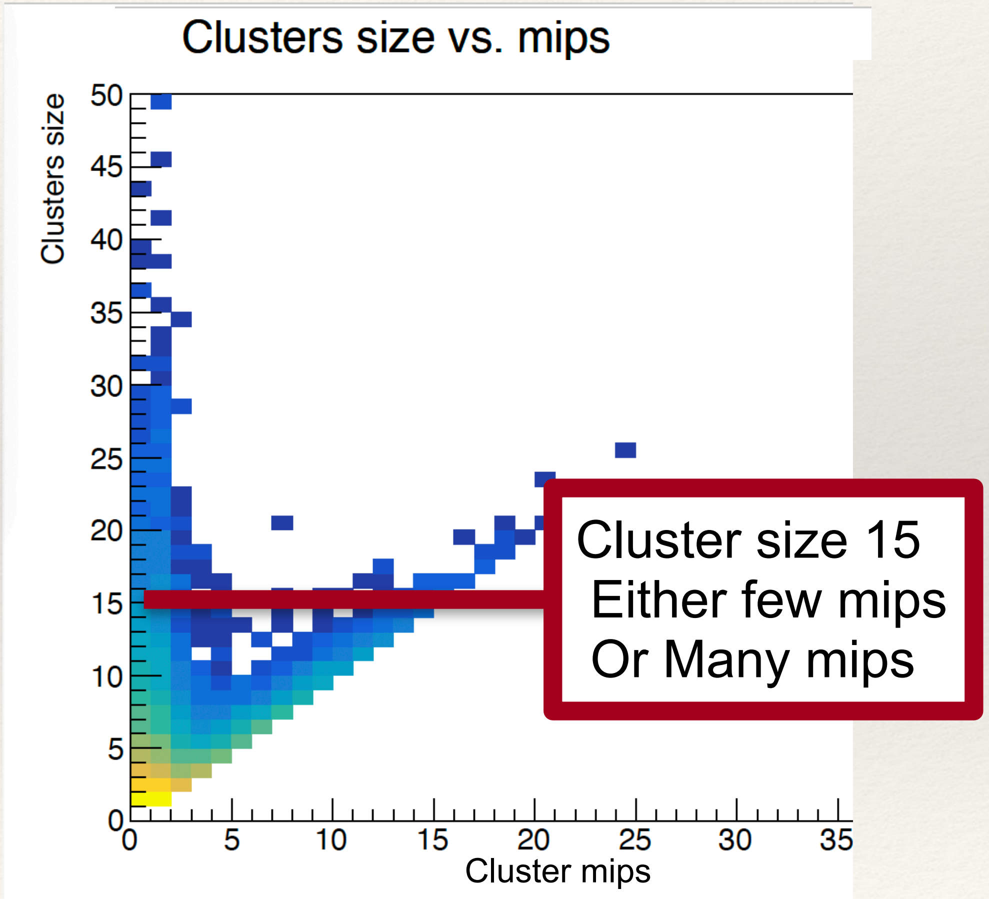


Simple cluster performance is better than hit counting.

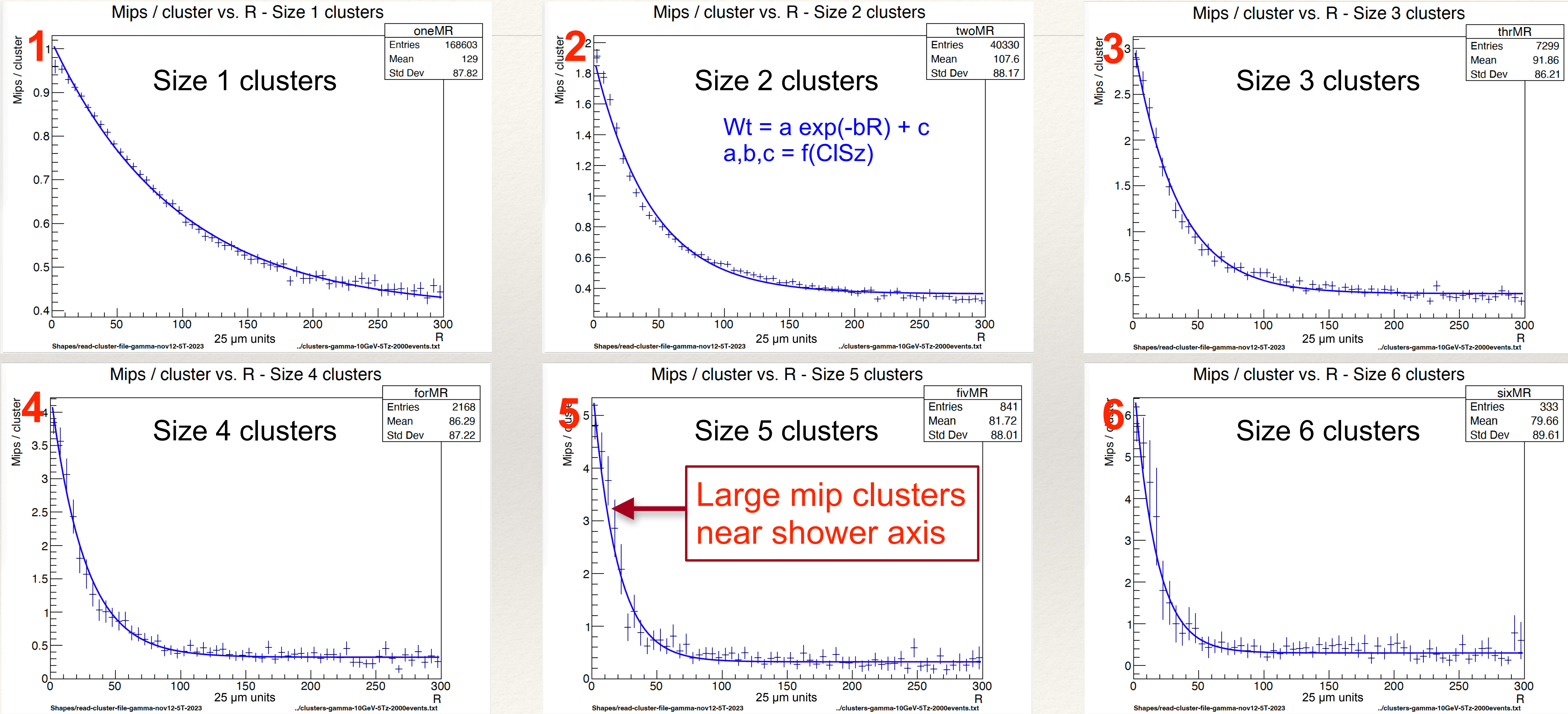
All Clusters are not the same



- Some clusters are numerous mips.



Mips/cluster 10 GeV γs - 2000 showers

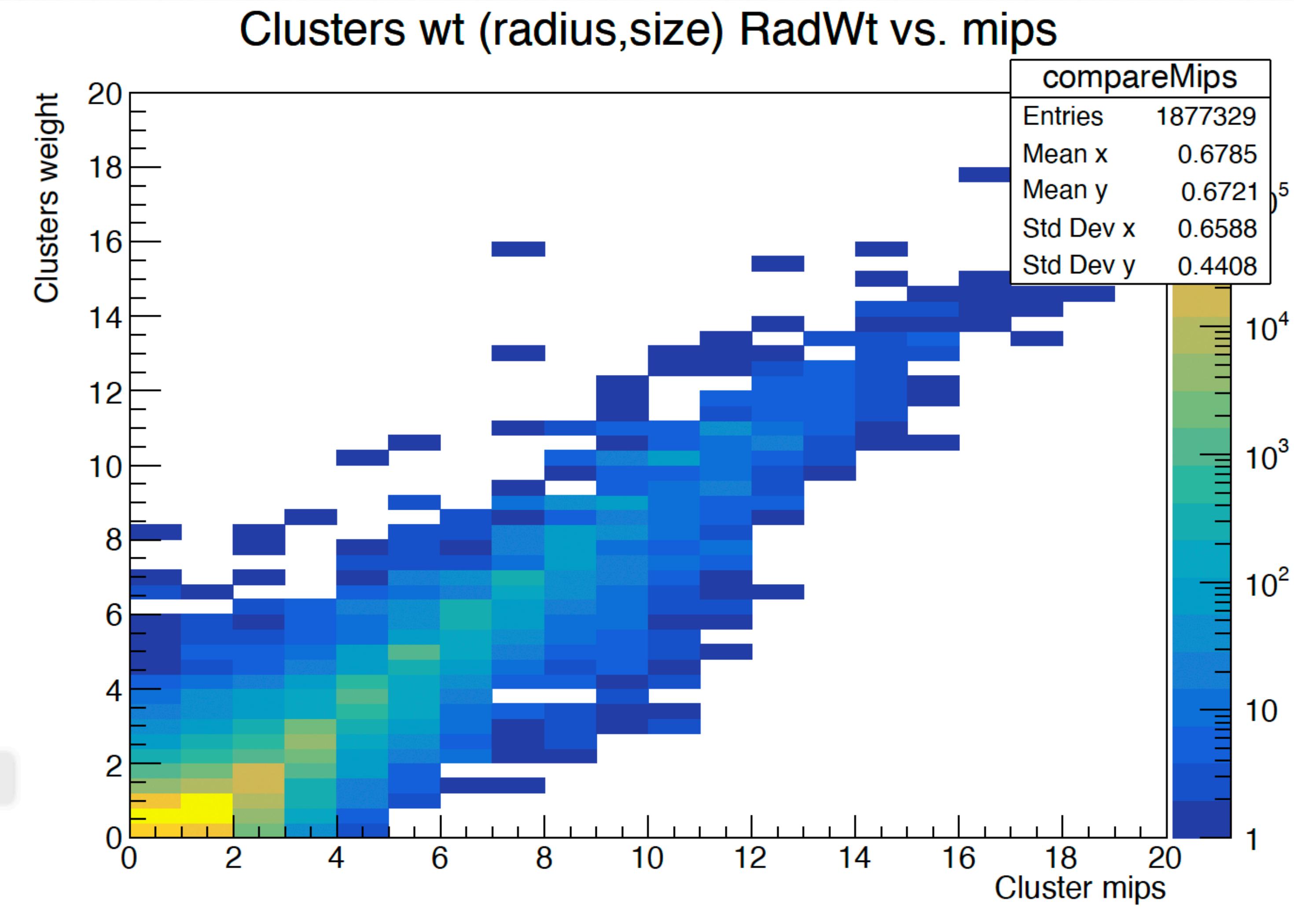


10 GeV γs - 2000 showers

Apply weight to clusters:

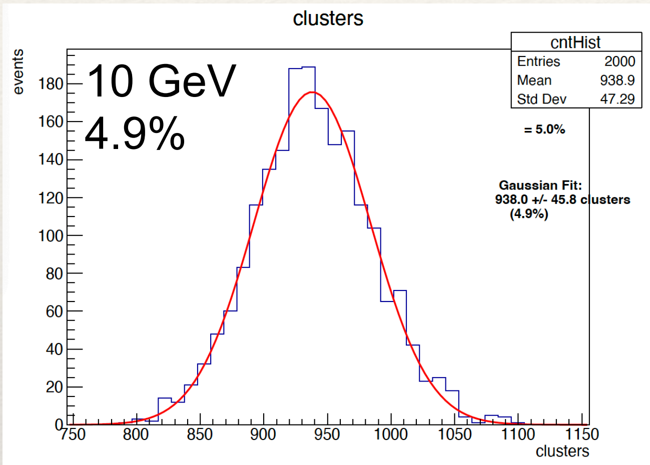
RadWt = a exp(-bR) + c

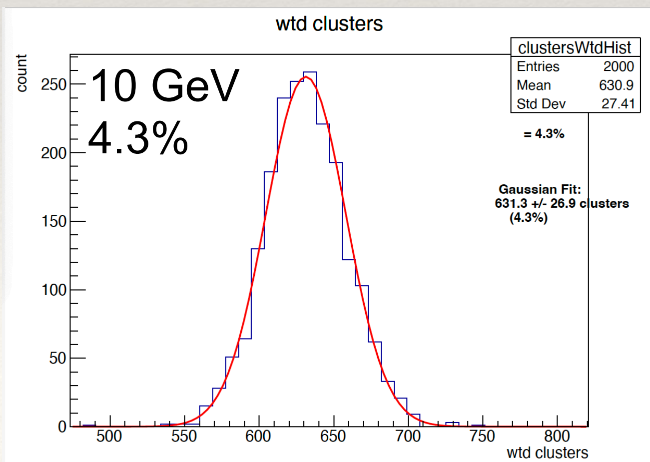
a,b,c = f(ClSz)

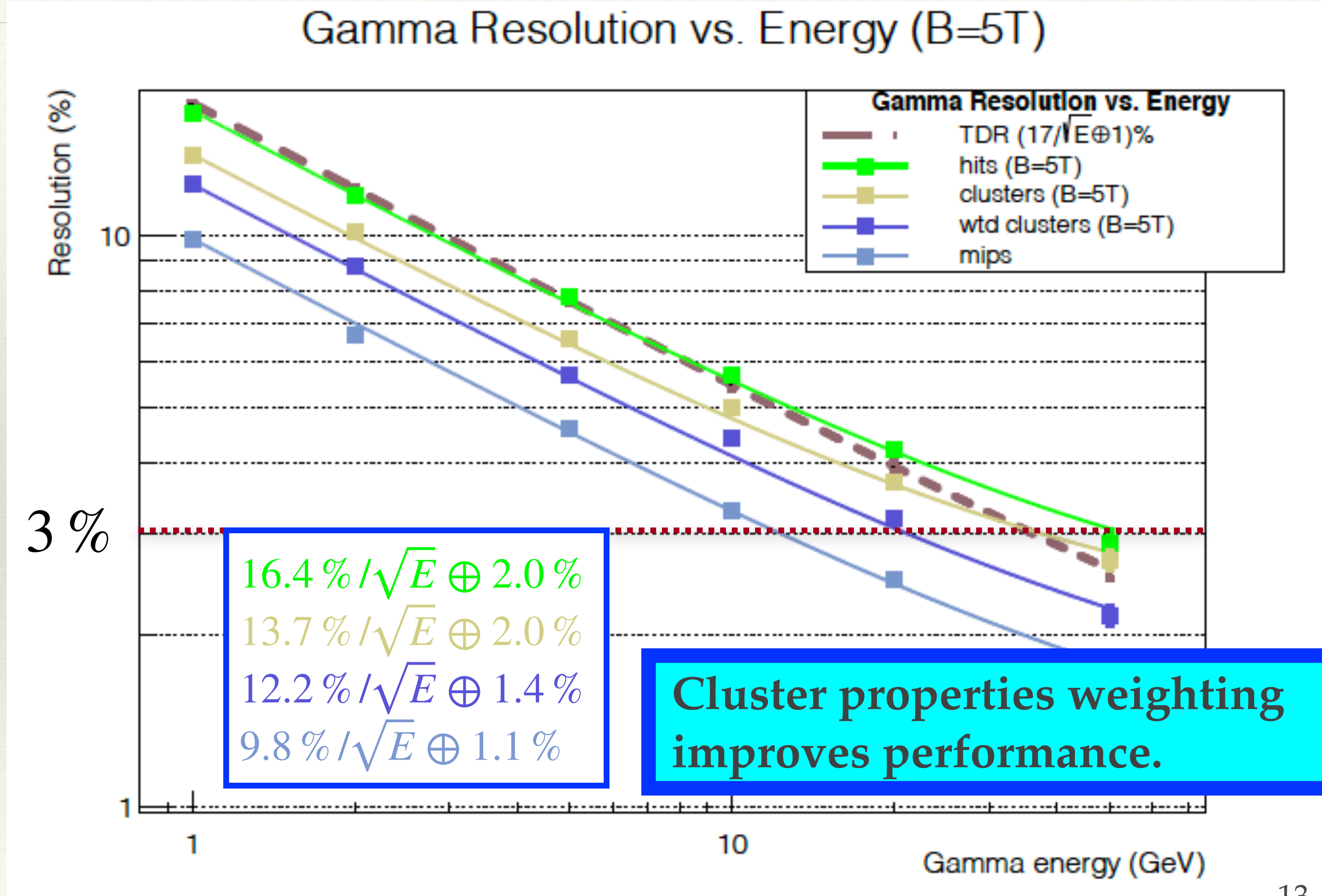


Resolution vs. Energy (hits/clusters/mips)

Resolution vs. Energy
(hits/clusters/mips)
& weighted clusters.







$16.4\,\%/\sqrt{E} \oplus 2.0\,\%$

$13.7\,\%/\sqrt{E} \oplus 2.0\,\%$

$12.2\,\%/\sqrt{E} \oplus 1.4\,\%$

$9.8\,\%/\sqrt{E} \oplus 1.1\,\%$

Cluster properties weighting improves performance.

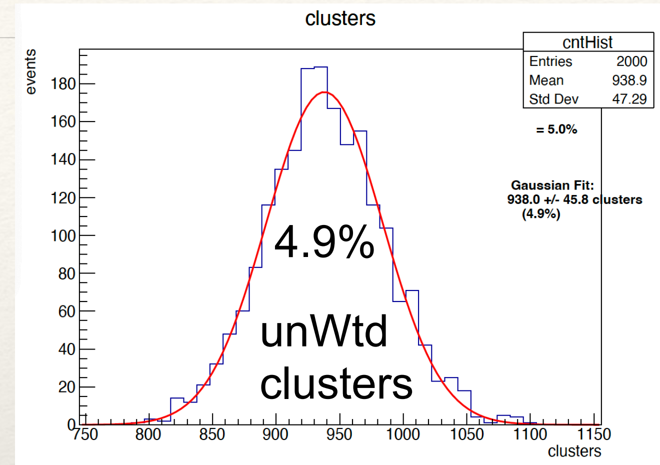
TMVA Neural Net

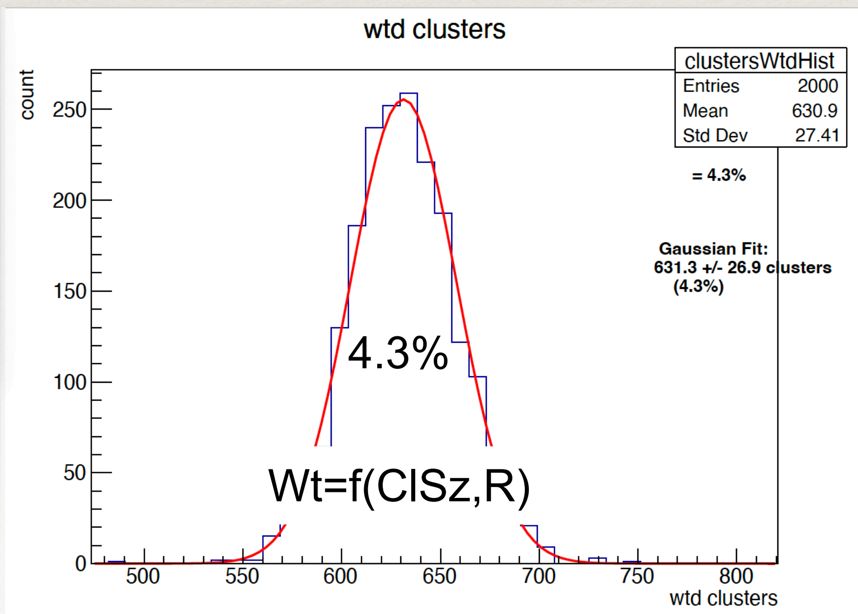
TRAINING - 10 GeV
- 2000 events
- 2,502,000 hits
- 1,878,999 clusters

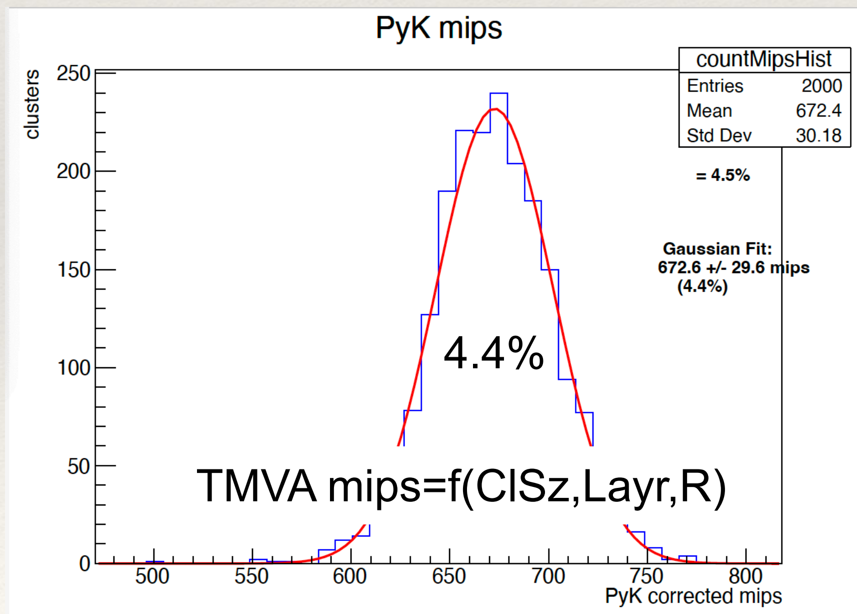
Neural net cluster weighting based on
1. Three input parameters =
   Cluster size,layer num,shower radius
2. Five input parameters =
   Add cluster length in Y and Z

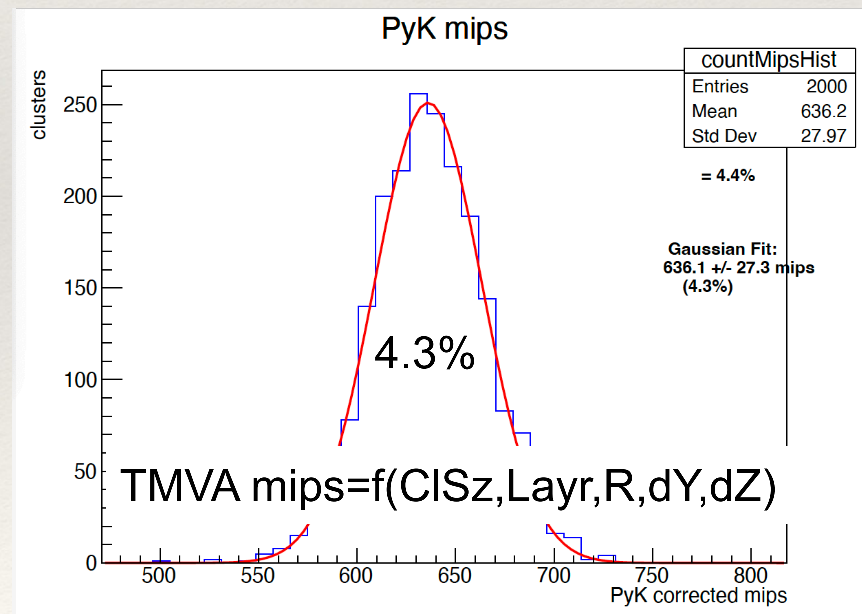
```
# Store model to file
model.save('modelRegression%s.h5'%Efact)
model.summary()

# Book methods
factory.BookMethod(dataloader, TMVA.Types.kPyKeras, 'PyKeras',
        'H:!
V:VarTransform=D,G:FilenameModel=modelRegression%s.h5:FilenameTrainedModel=
trainedModelRegression%s.h5:NumEpochs=20:BatchSize=32'%(Efact,Efact))
```

Weighted function vs. TMVA neural net (10 GeV γs)









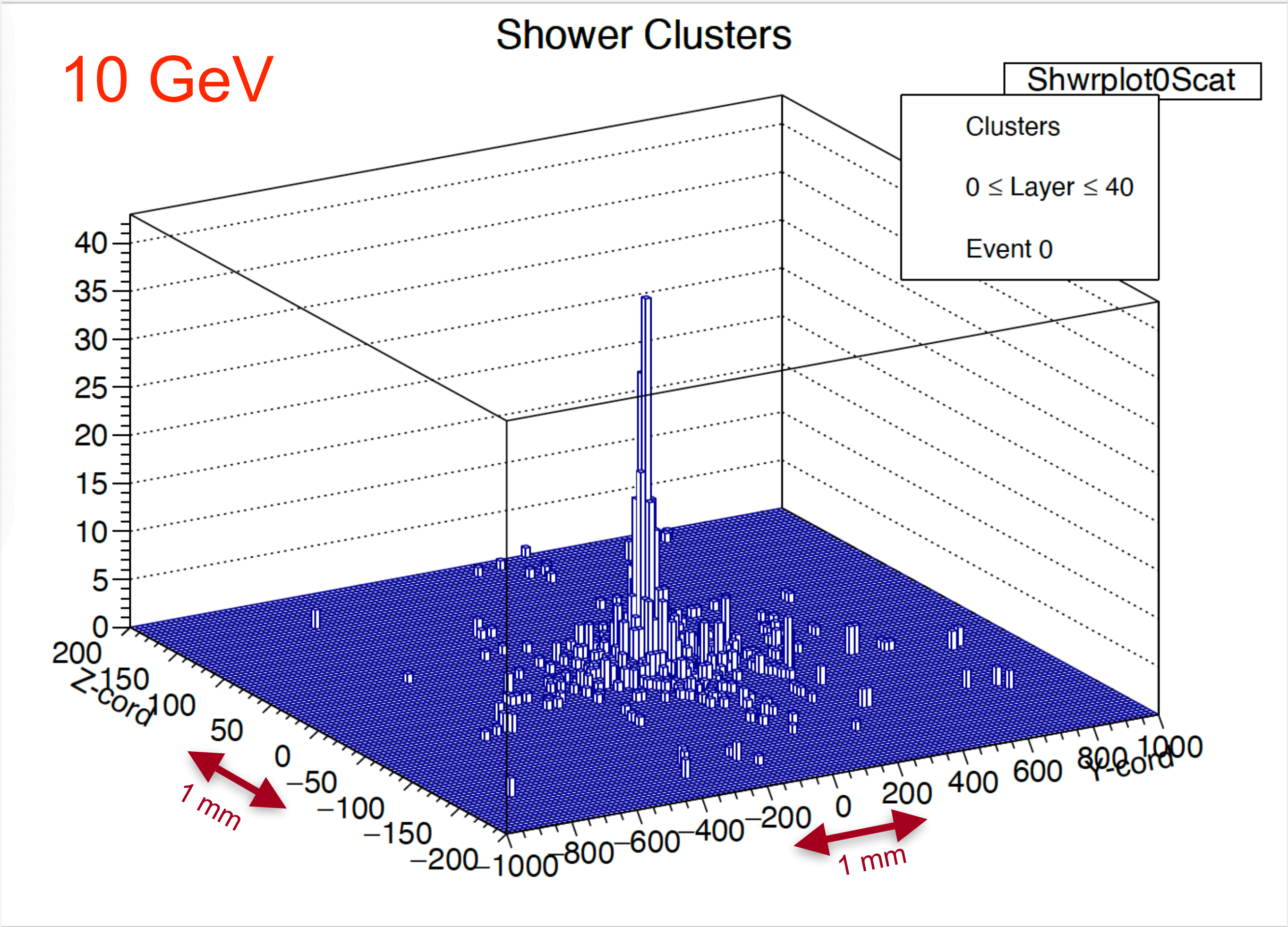
Results: Energy Resolution

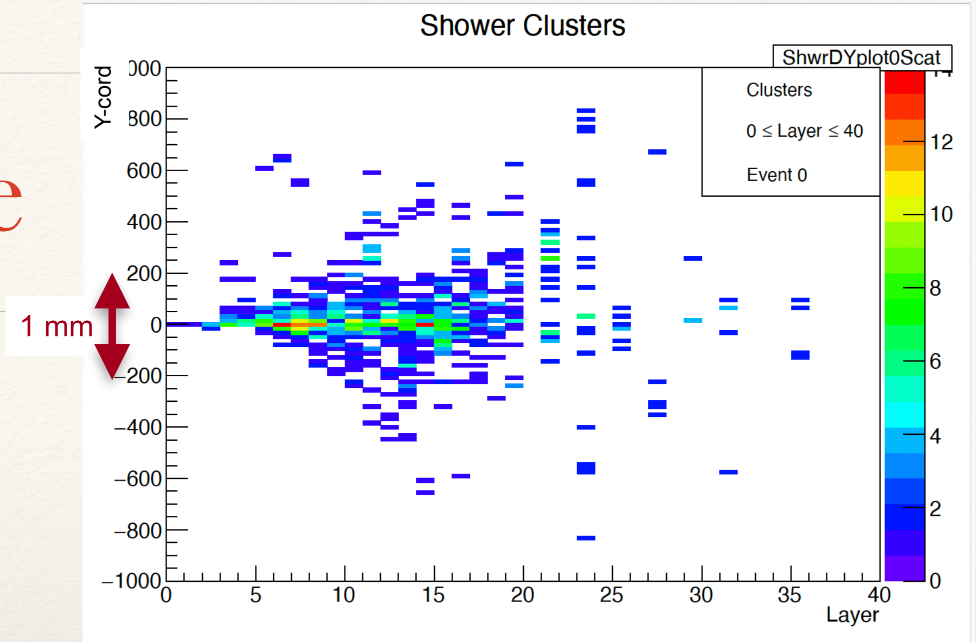
Energy	1	2	5	10	20	50
clusters	13.8%	10.1%	6.6%	4.9%	3.7%	2.7%
wtd clusters	12.3%	8.8%	5.7%	4.4%	3.2%	2.2%
3 par TMVA	12.6%	9.5%	6.2%	4.4%	3.4%	2.2%
5 par TMVA	12.8%	9.4%	5.9%	4.3%	3.1%	2.2%

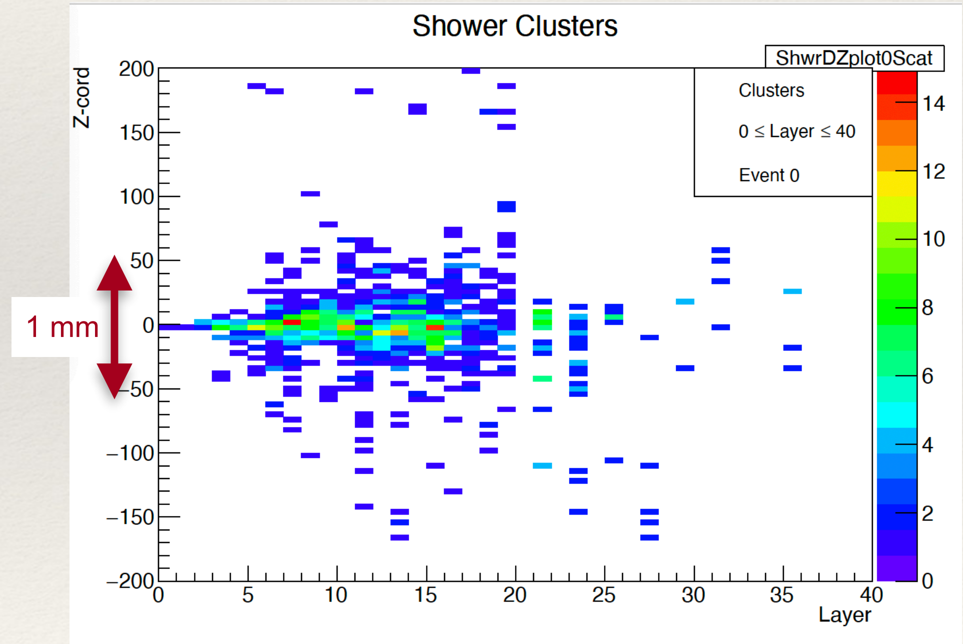
- Weight fits for 2, 10, 50 GeV; extrapolated for 1, 5, 20 GeV.
- NN optimized for each energy
- 3 par = cluster size, layer, radius
- 5 par = cluster size, layer, radius, dY, dZ

Weighted clusters already achieve performance of this neural net.

Transverse Shower Structure

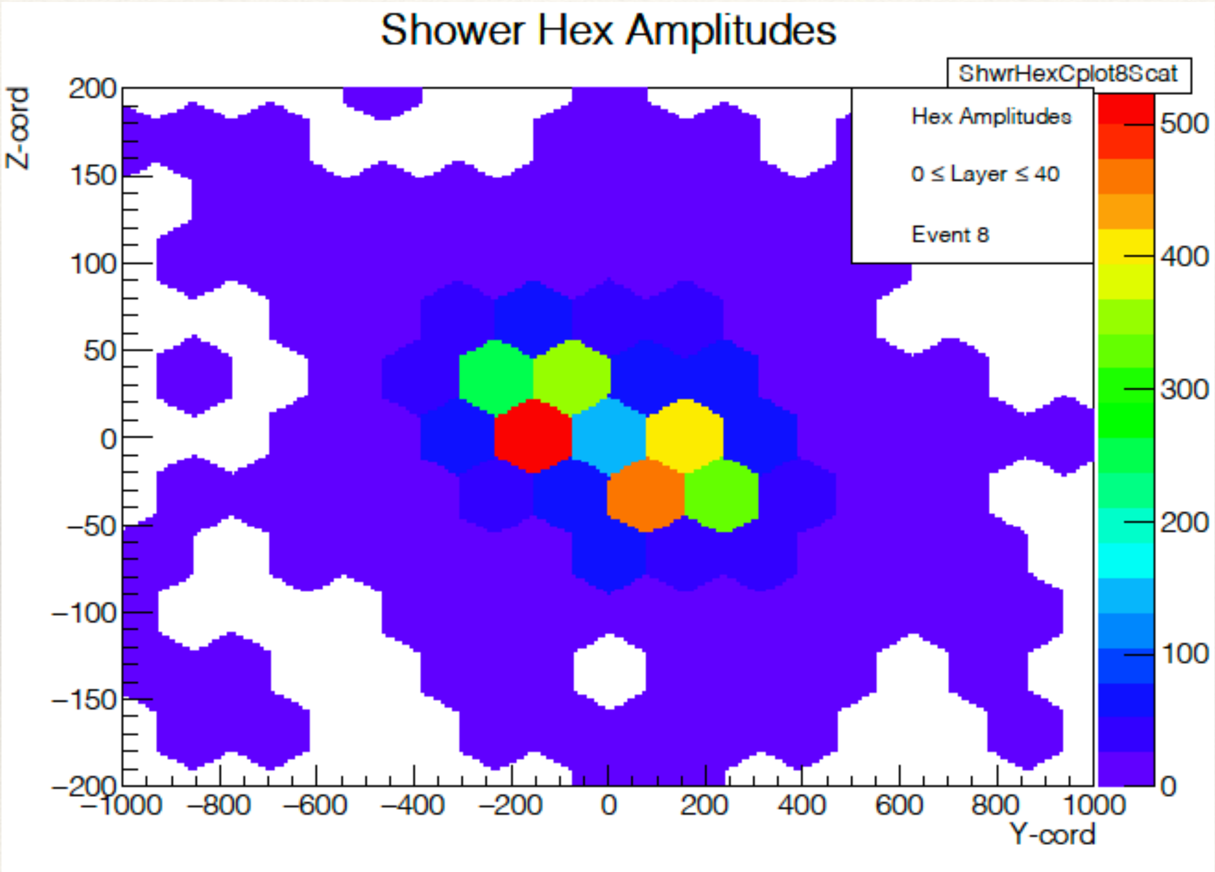




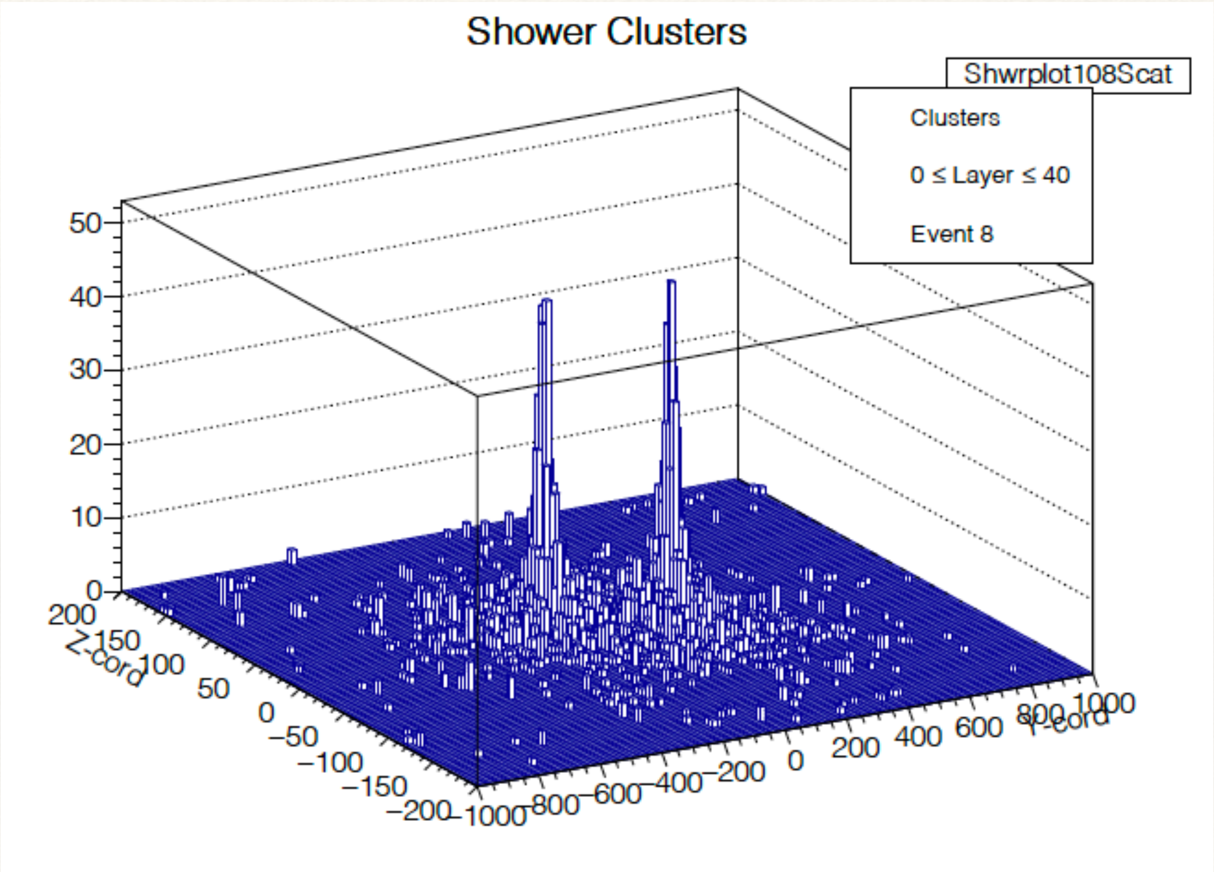


Multi-shower of SiD MAPS compared to SiD TDR

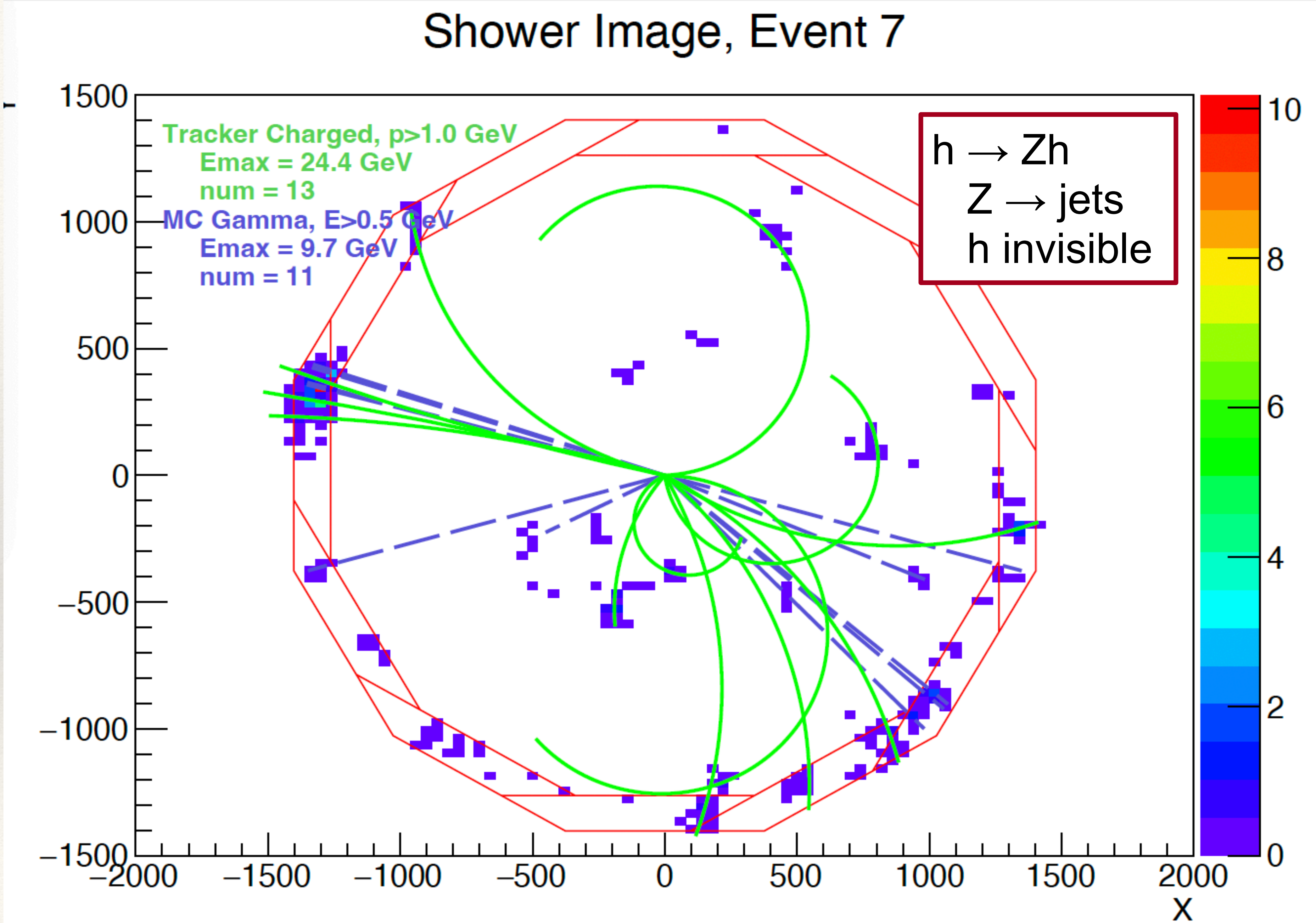
40 GeV $\pi^0 \rightarrow$ two 20 GeV γ's



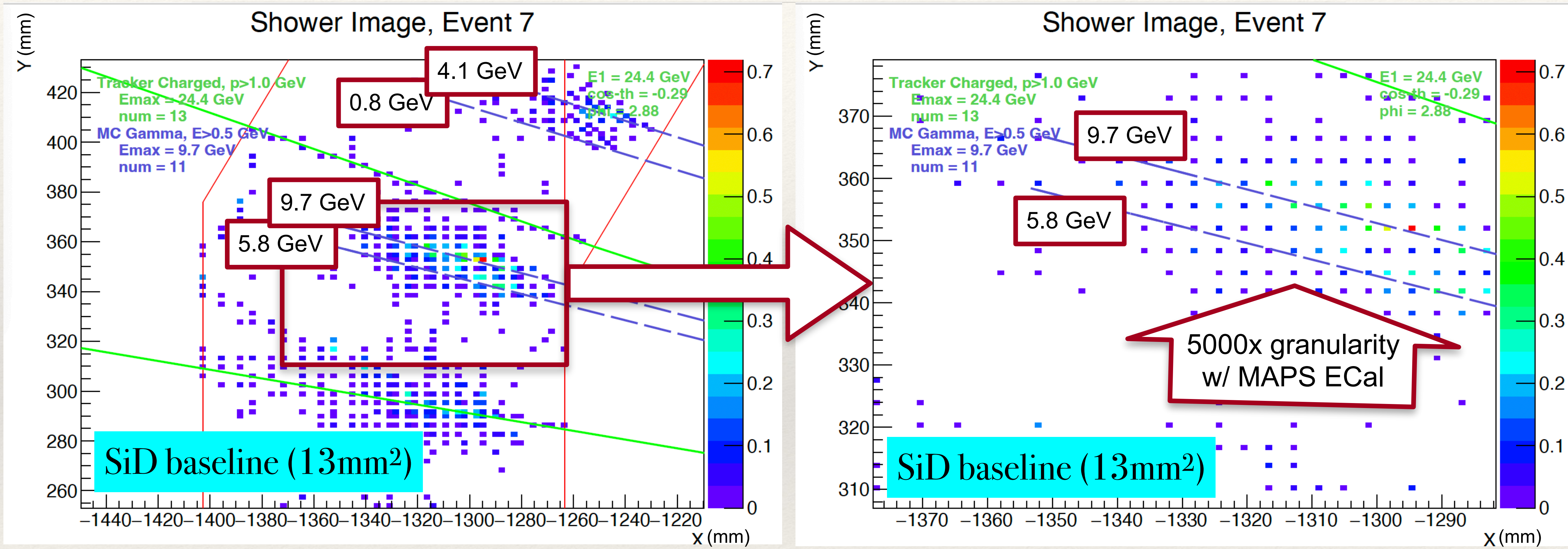
SiD TDR hexagonal sensors
13 mm² pixels



New SiD fine pixel sensors
25 μm x 100 μm pixels


Shower Image, Event 7
Tracker Charged, p>1.0 GeV
Emax = 24.4 GeV
num = 13
MC Gamma, E>0.5 GeV
Emax = 9.7 GeV
num = 11
h → Zh
Z → jets
h invisible
1500
1000
500
0
−500
−1000
−1500
−2000
−1500
−1000
−500
0
500
1000
1500
2000
X
10
8
6
4
2
0

γ's in jet / SiD baseline ECal (13mm² pixels)



- 13 mm² pixels of analog SiD ECal
- 5000x granularity with digital MAPS ECal
- Upcoming integration into SiD simulation will define scale of improvement?

Conclusion

- Application of monolithic active pixel sensors (MAPS) to SiD digital ECal offers excellent performance:
  - Energy measurement
  - Transverse energy containment & multiple shower separation
- The well defined structure of EM showers allows simple algorithmic improvement in energy measurement.
- Neural nets have been studied to improve energy measurement:
  - They have not yet provided improvement over the "informed" algorithm.
- Future - simulation of full SiD detector with high granularity of MAPS ECal