

*Towards a clustering algorithm for  
CALICE*

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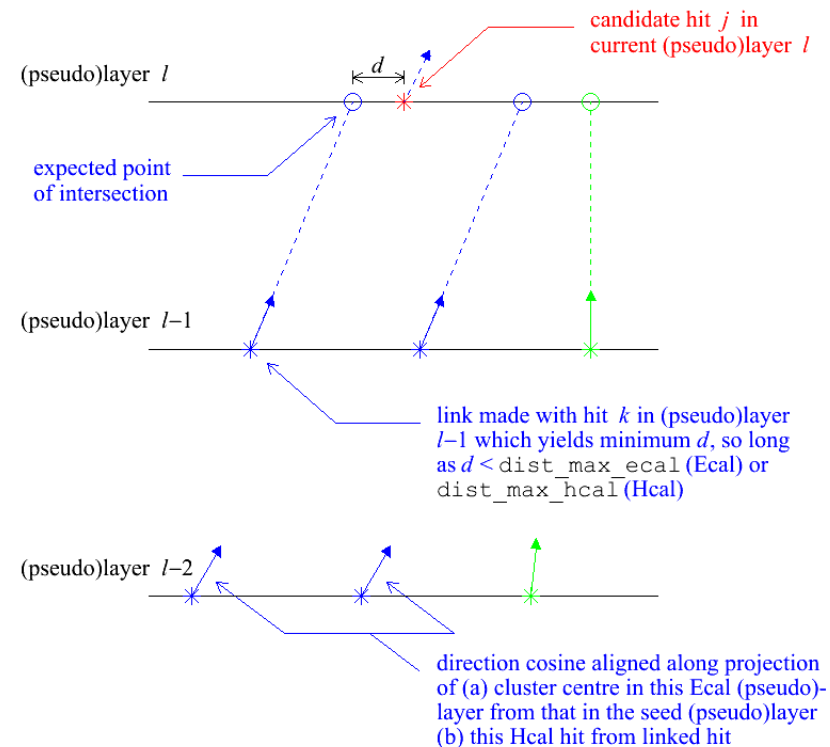
*General CALICE meeting  
7-8 December 2004, DESY, Germany*

## *Order of service*

- Layer-by-layer approach to clustering.
- Application to a generalised calorimeter.
- Reconstructed event gallery for two close-by particles.
- How to quantify the two-particle separation “quality” and use it to optimise clustering cuts.
- Quality studies for nearby  $\pi^+\gamma$ ,  $\pi^+n$ ,  $\pi^+\pi^+$  and  $nn$ .
- Quality dependence on hadronic shower model.
- Summary.

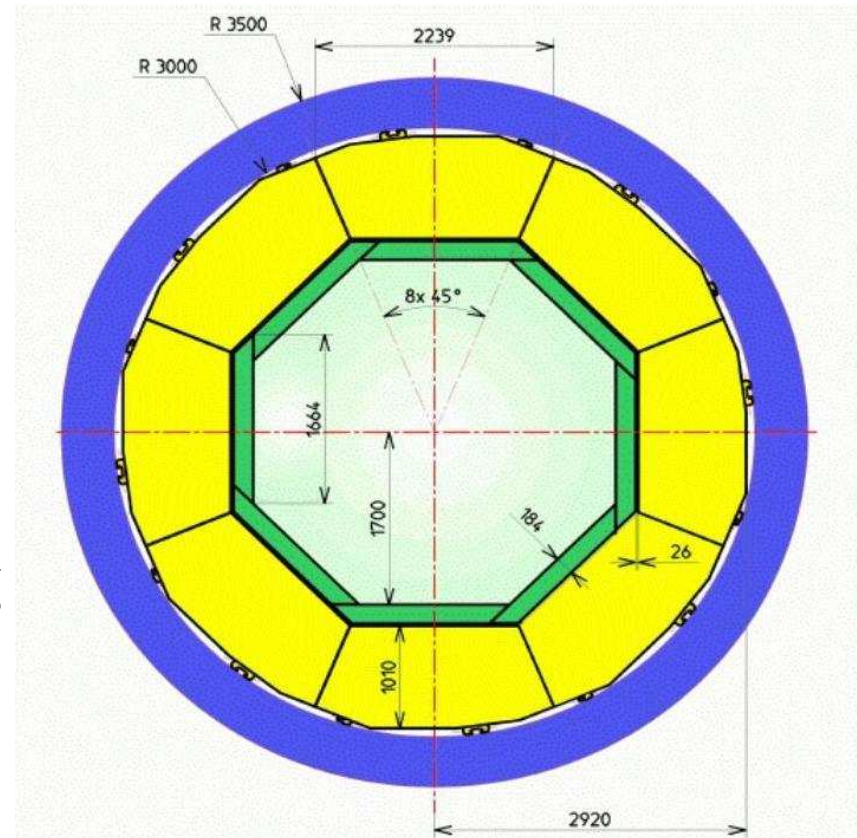
# Layer-by-layer clustering: the algorithm

- Form clusters by tracking closely-related hits ( $> 1/3$  mip) *layer-by-layer* through calorimeter:
  - for a given hit  $j$  in a given layer  $l$ , minimize the distance  $d$  w.r.t all hits  $k$  in layer  $l-1$ ;
  - if  $d < \text{dist\_max\_ecal}$  (Ecal) or  $\text{dist\_max\_hcal}$  (Hcal) for minimum  $d$ , assign hit  $j$  to same cluster as hit  $k$  which yields minimum;
  - if not, repeat with all hits in layer  $l-2$ , then, if necessary, layer  $l-3$ , etc., right through to first layer of Ecal;
  - after iterating over all hits  $j$ , seed new clusters with those still unassigned;
  - if in Ecal, calculate weighted centre of each cluster's hits in layer  $l$  (weight by energy (analogue) or density (digital)) and assign a direction cosine to each hit along the line joining its cluster's centre in the seed layer (or  $(0,0,0)$  if it's a seed) to its cluster's centre in layer  $l$ ;
  - if in Hcal, assign a direction cosine to each hit along the line from the hit to which each is linked (or  $(0,0,0)$  if it's a seed) to the hit itself;
  - try to recover backward-spiralling track-like, and low multiplicity 'halo', cluster fragments
  - ...



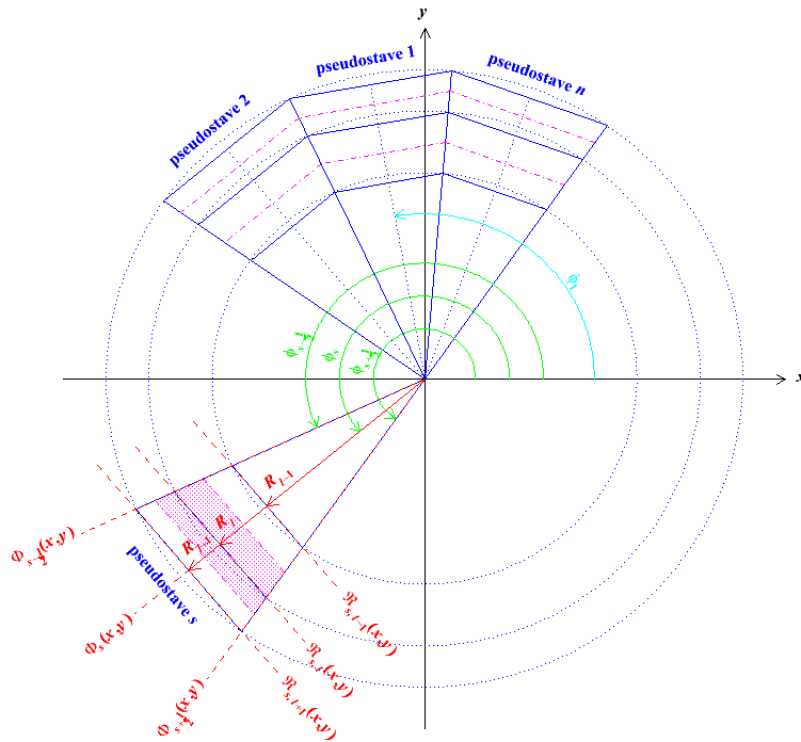
# Layer-by-layer clustering in a generalised detector

- Approach requires layer index to vary smoothly:  
e.g. in CALICE, index changes abruptly
  - at stave boundaries in Ecal barrel (layers overlap at  $45^\circ$ );
  - at barrel/endcap boundaries in Ecal & Hcal (layers overlap at  $90^\circ$ ).
- Scheme developed (see CERN, Durham talks) to overcome problem; extended to apply to any arbitrary  $n$ -fold rotationally-symmetric, layered calorimeter.
- Achieved by replacing layer index with *pseudolayer* index in regions where layer index discontinuities occur.
- Same-pseudolayer indexed hits defined by closed shells of  $n$ -polygonal prisms (e.g. CALICE:  $n = 8 \Rightarrow$  octagonal prisms) coaxial with  $z$ -axis.
- Locations/orientations of shells automatically set by locations/orientations of real, physical, sensitive layers.
- Just takes  $n$  and layer-spacings in barrel and endcaps as input.

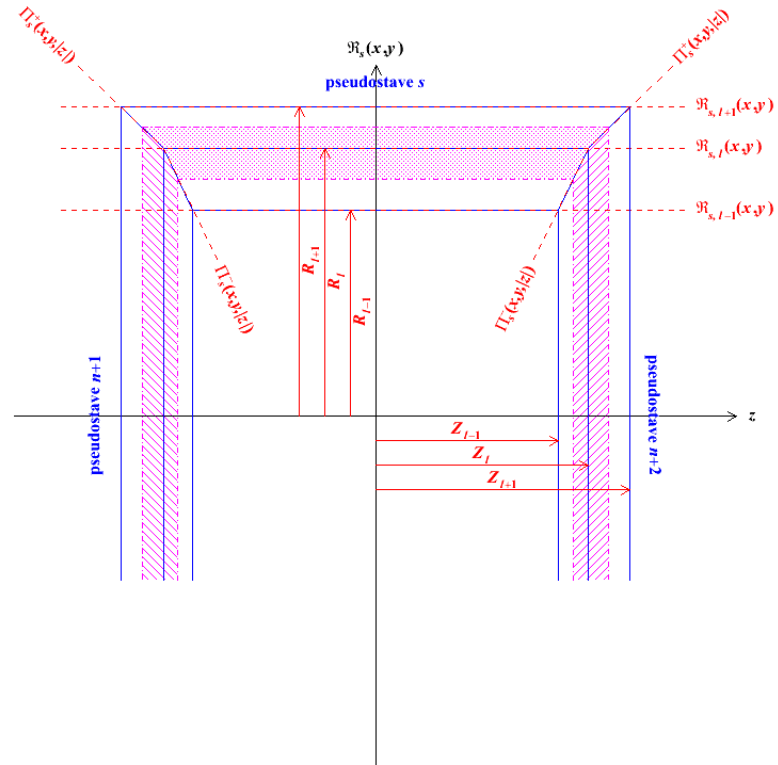


# How the generalised detector shapes up

## Transverse section



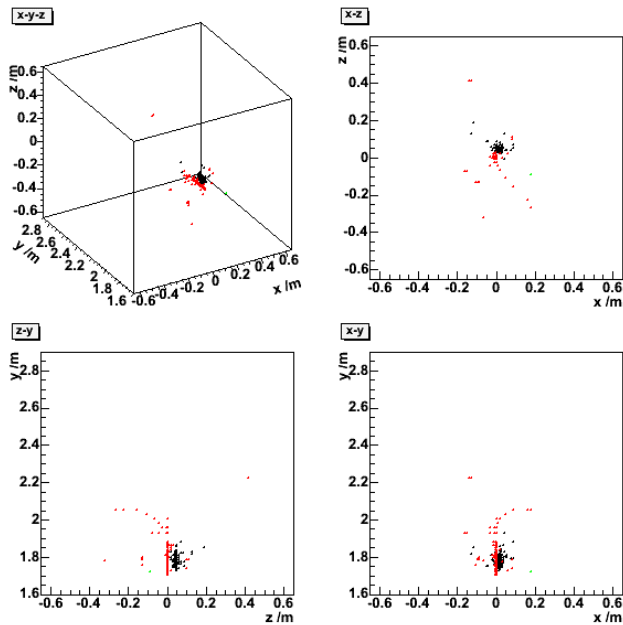
## Longitudinal section



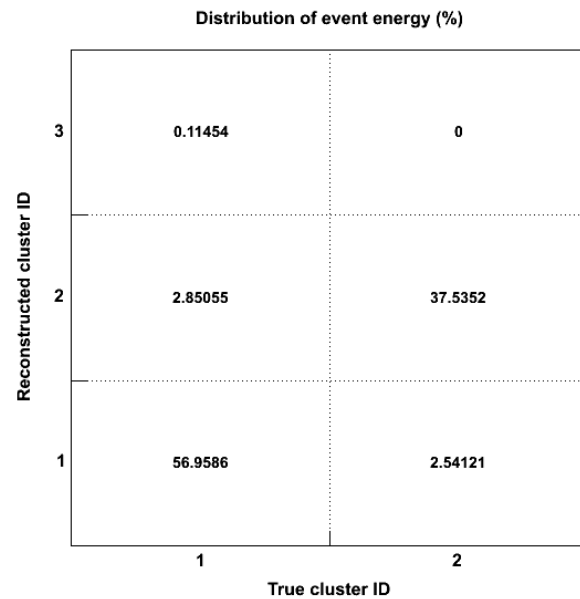
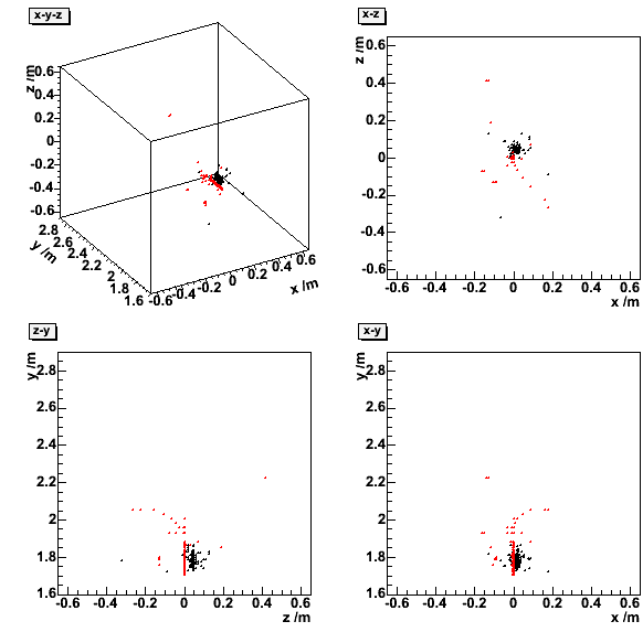
- Solid blue lines aligned along real, physical, sensitive layers.
- Dot-dashed magenta lines bound shell containing hits with same *pseudolayer* index,  $l$ .

# 5 GeV $\pi^+\gamma$ event at 5 cm separation

## Reconstructed clusters



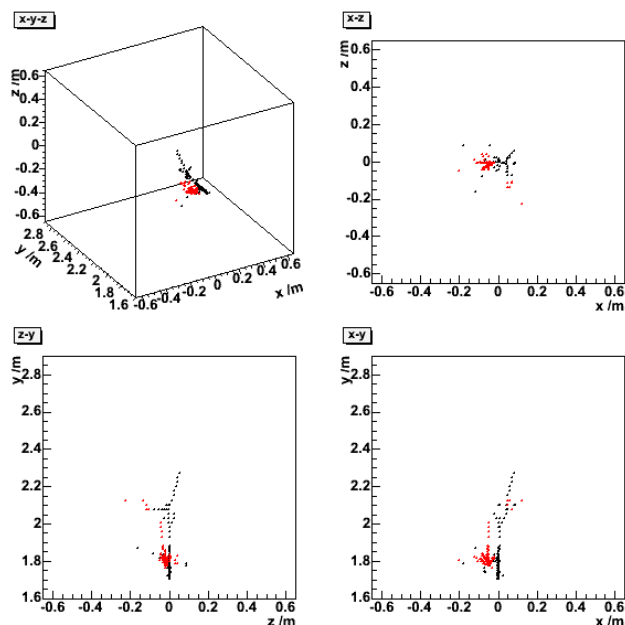
## True particle clusters



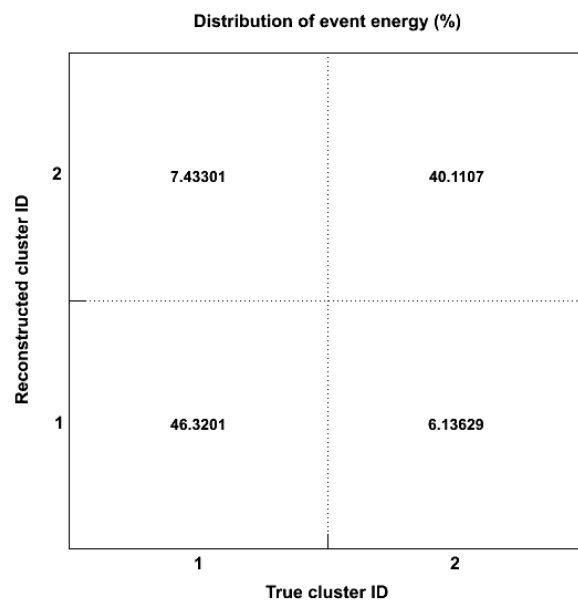
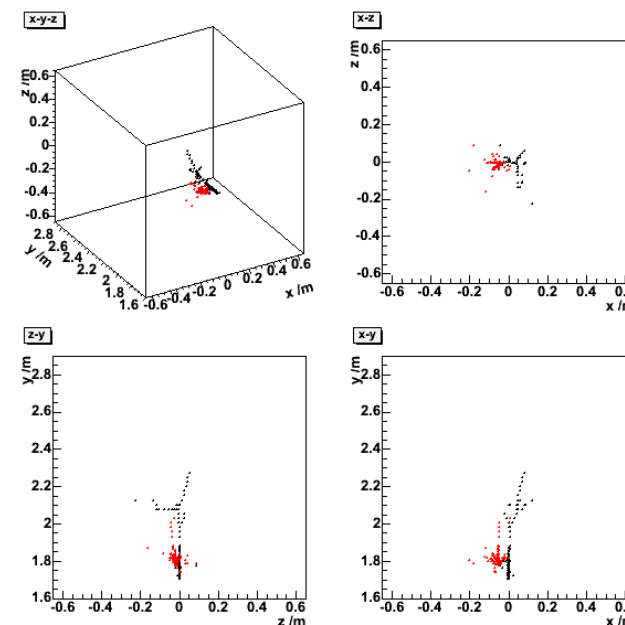
- Energy maps mostly *black*  $\leftrightarrow$  *black* ( $\gamma$ ) and *red*  $\leftrightarrow$  *red* ( $\pi^+$ ).
- Quality = 57.0 + 37.5 = 94 %.

# 5 GeV $\pi^+n$ event at 5 cm separation

## Reconstructed clusters



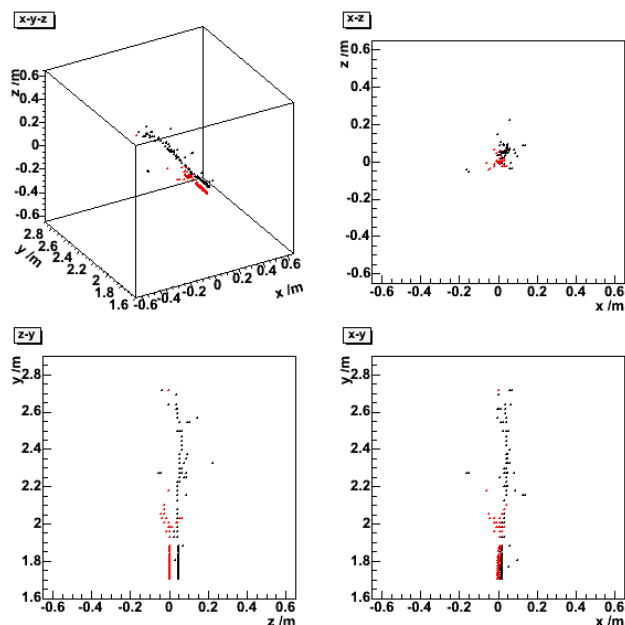
## True particle clusters



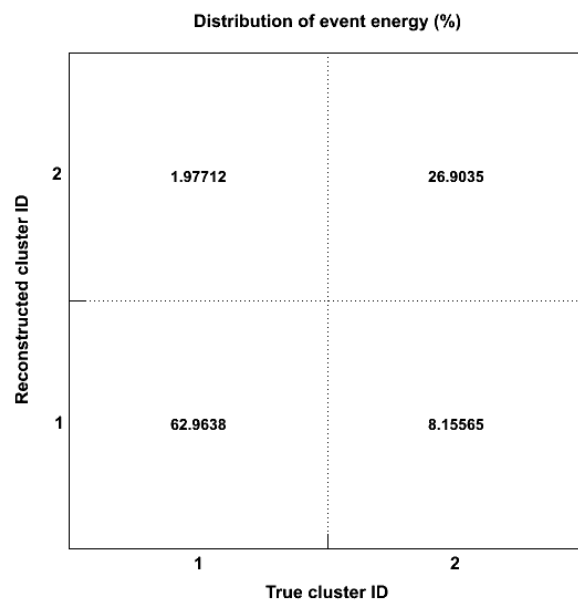
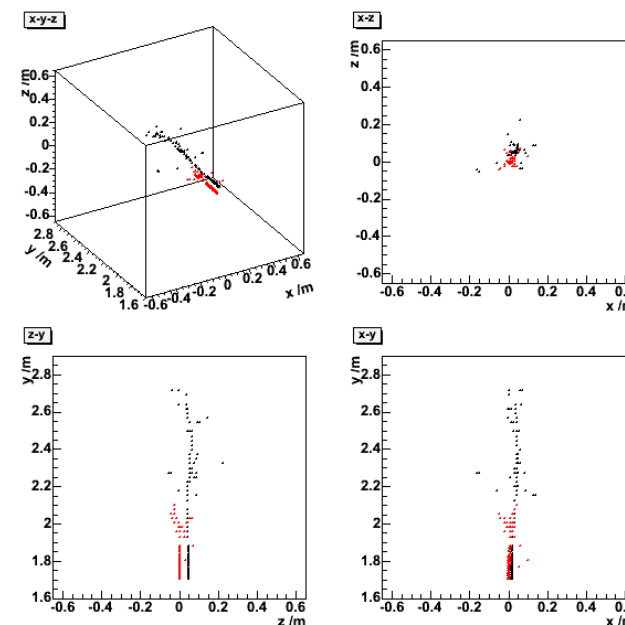
- Energy maps mostly *black*  $\leftrightarrow$  *black* ( $\pi^+$ ) and *red*  $\leftrightarrow$  *red* (*n*).
- Quality = 46.3 + 40.1 = 86 %.

# 5 GeV $\pi^+\pi^+$ event at 5 cm separation

## Reconstructed clusters



## True particle clusters

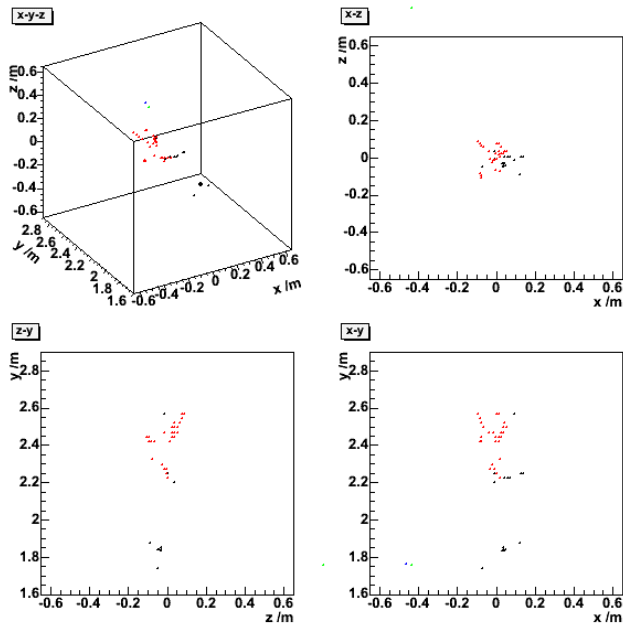


- Energy maps mostly *black*  $\leftrightarrow$  *black* and *red*  $\leftrightarrow$  *red*.
- Quality = 63.0 + 26.9 = 90 %.

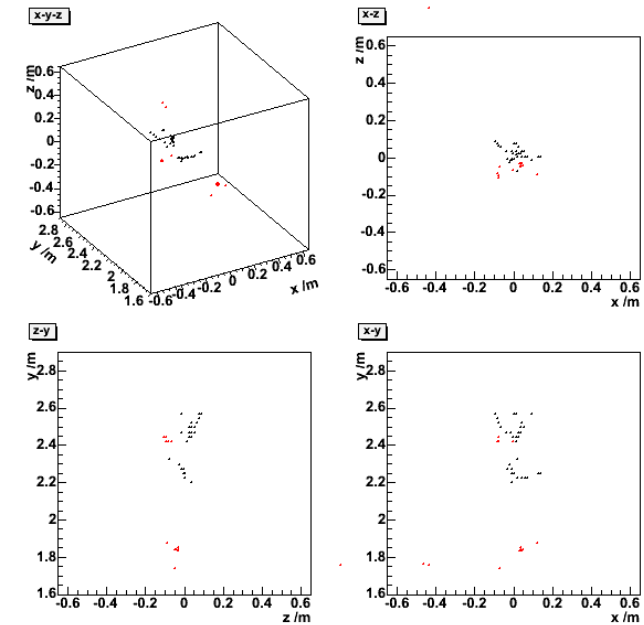


# 5 GeV nn event at 5 cm separation

## Reconstructed clusters



## True particle clusters



Distribution of event energy (%)

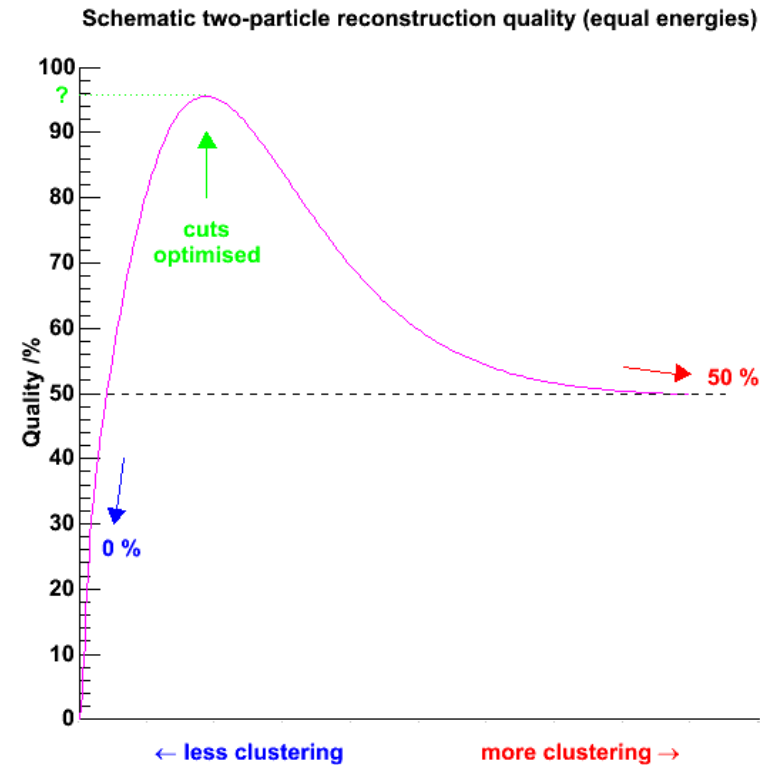
Reconstructed cluster ID	True cluster ID 1	True cluster ID 2
4	0	0.0872328
3	0	0.10734
2	38.5551	8.38154
1	13.4105	39.4583

- Energy maps mostly *black*  $\leftrightarrow$  *red* and *red*  $\leftrightarrow$  *black*.
- Quality = 39.5 + 38.6 = 78 %.

# Two-particle separation quality: definition

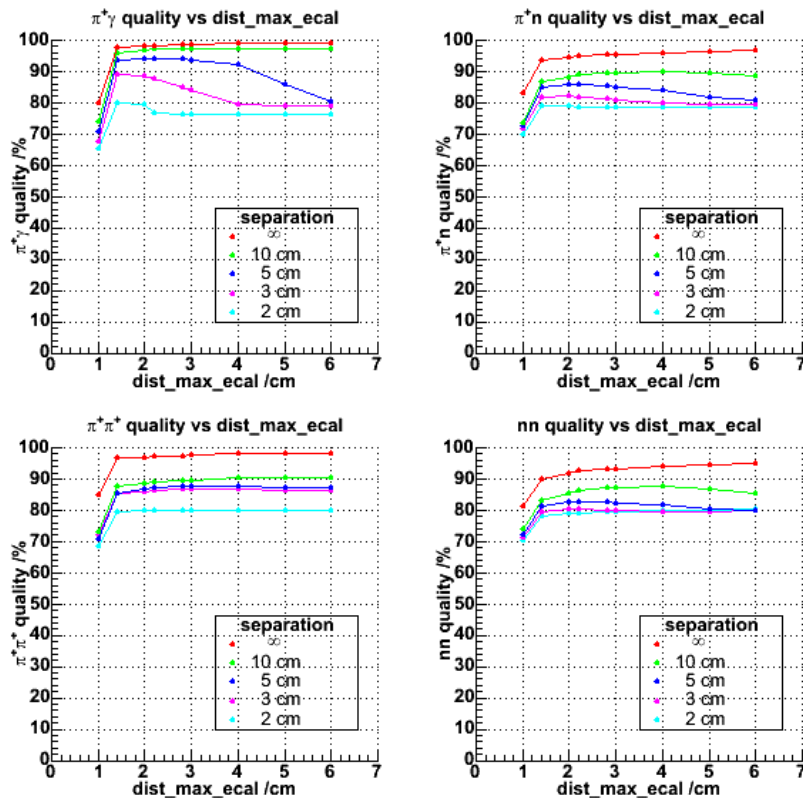
- Need to grade performance of clustering algorithm (in absence of full particle-flow algorithm).
- Want to optimise both:
  - *efficiency* – how closely true particle clusters correspond to reconstructed clusters; and
  - *purity* – how closely reconstructed clusters correspond to true particle clusters.
- Propose a figure of merit:  
*Quality = fraction of event energy that maps in a 1:1 ratio between reconstructed and true clusters.*
- Combines efficiency and purity into a single, useful measure.
- For two equal-energy particles, expect
  - no clustering (i.e. “hit” = reconstructed cluster):  
 ⇒ energy in true clusters divided between many reconstructed clusters;  
 ⇒ quality → 0;
  - over-exaggerated clustering (i.e. “event” = reconstructed cluster):  
 ⇒ energy in single reconstructed cluster divided between two (equal-energy) true clusters;  
 ⇒ quality → 50 %;
  - optimal clustering:  
 ⇒ lies somewhere in between; where?  
 ⇒ quality = ?
- Demonstrate principle by varying the `dist_max_ecal` and `dist_max_hcal` cuts.
- Energy calibrated (D09 detector) according to:  

$$E = \alpha[(E_{\text{Ecal}; 1-30} + 3E_{\text{Ecal}; 31-40})/E_{\text{mip}} + 20N_{\text{Hcal}}] \text{ GeV.}$$



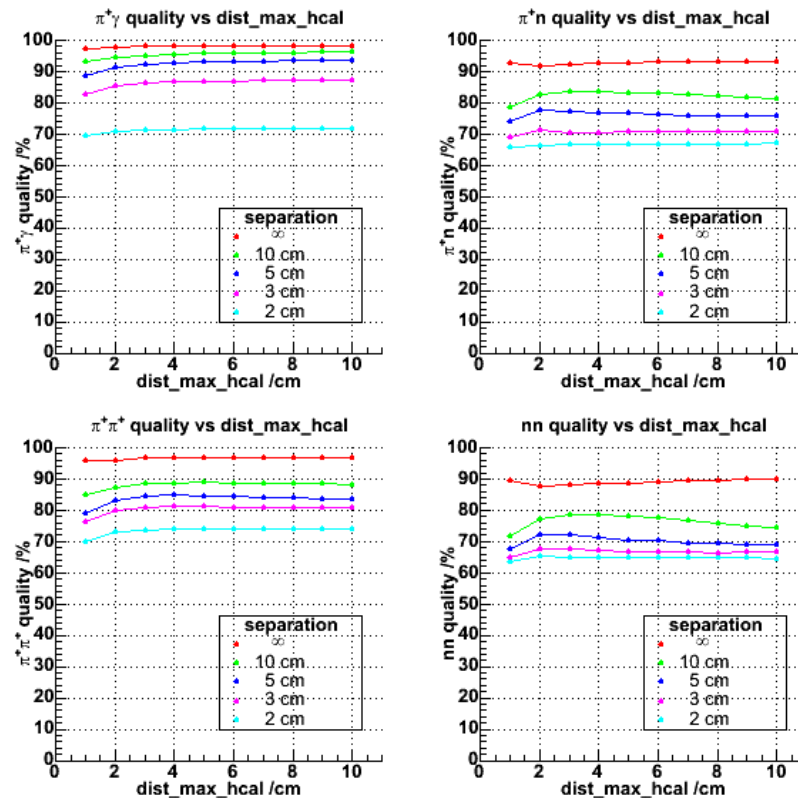
# 5 GeV two-particle quality vs clustering cuts

## Ecal only



- Ecal quality peaks/plateaus (all particles/separations) around  $\text{dist\_max\_ecal} = 2$  cm.
- Physically reasonable ( $1 \times 1$  cm<sup>2</sup> cells). Fix it.

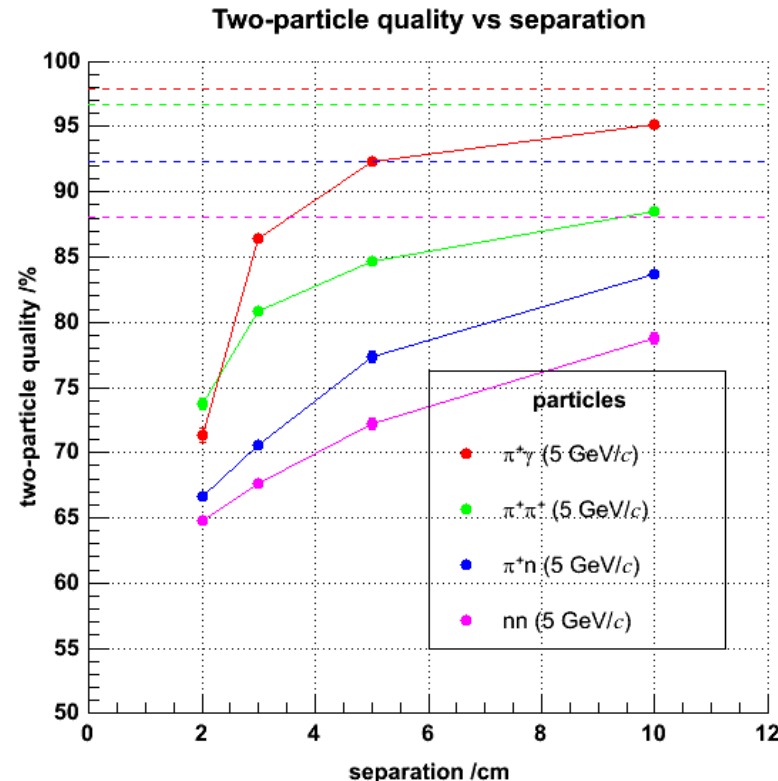
## Ecal + Hcal



- Hcal quality peaks/plateaus (all particles/separations) around  $\text{dist\_max\_hcal} = 3$  cm.
- Again, physically reasonable. Fix this too.

## 5 GeV two-particle quality vs separation

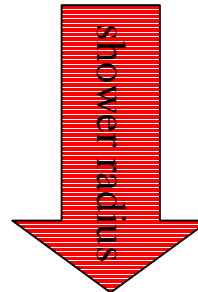
- Goal: to distinguish charged clusters from neutral clusters in calorimeters.
- Separation of  $\pi^+\gamma$  and  $\pi^+n$  very important; that of  $\pi^+\pi^+$  and  $nn$  less so (but still interesting).
- Quality improves with separation (naturally).
- $\pi^+\gamma$  separation at 5 GeV seems to be pretty good;  $\pi^+n$  is somewhat tougher (n by itself is tricky – dashed magenta line).
- Do things change much with energy / incident angle / other pairs of particles / pad-size / hadronic shower model...?



dist\_max\_ecal = 2.0 cm (fixed);  
dist\_max\_hcal = 3.0 cm (fixed).

## $\pi^+ \pi^+$ quality vs hadronic shower model

- Survey by G. Mavromanolakis (see CERN, Durham talks)  $\Rightarrow$  different hadronic shower models give significant variations in predicted shower radius ( $\approx 35\%$  for  $10\text{ GeV } \pi^+$ ).
- Looked at dependence of quality on model for two  $5\text{ GeV } \pi^+$  separated by  $5\text{ cm}$ :
  - LHEP  $85.5 \pm 0.4\%$
  - QGSP\_BIC  $84.9 \pm 0.3\%$
  - LHEP\_BERT  $81.8 \pm 0.4\%$
  - LCPhys  $81.8 \pm 0.4\%$
- Quality decreases with increasing shower radius (as expected).
- Similar conclusions found with other separations; also for single  $\pi^+$ .
- Hadronic shower model impacts on pattern recognition predictions; ultimately significant for detector design.



## Summary & outlook

- R&D on clustering algorithm for CALICE on-going.
- Approach utilizes the high granularity of the calorimeter cells to “*track*” clusters (pseudo)layer-by-(pseudo)layer.
- Written in C++; LCIO (v1.3) compliant.
- Pseudolayer concept  $\Rightarrow$  flexibility to cope with alternative layered geometries without having to recode algorithm itself.
- Introduced quality gauge to assess performance of algorithm w.r.t. charged/neutral cluster separation.
- Using it
  - to guide refinements to algorithm and optimise clustering cuts.
  - to compare relative merits of different detector layouts.
- If considered helpful, can aim to make code publicly available within  $\sim 6$  months.

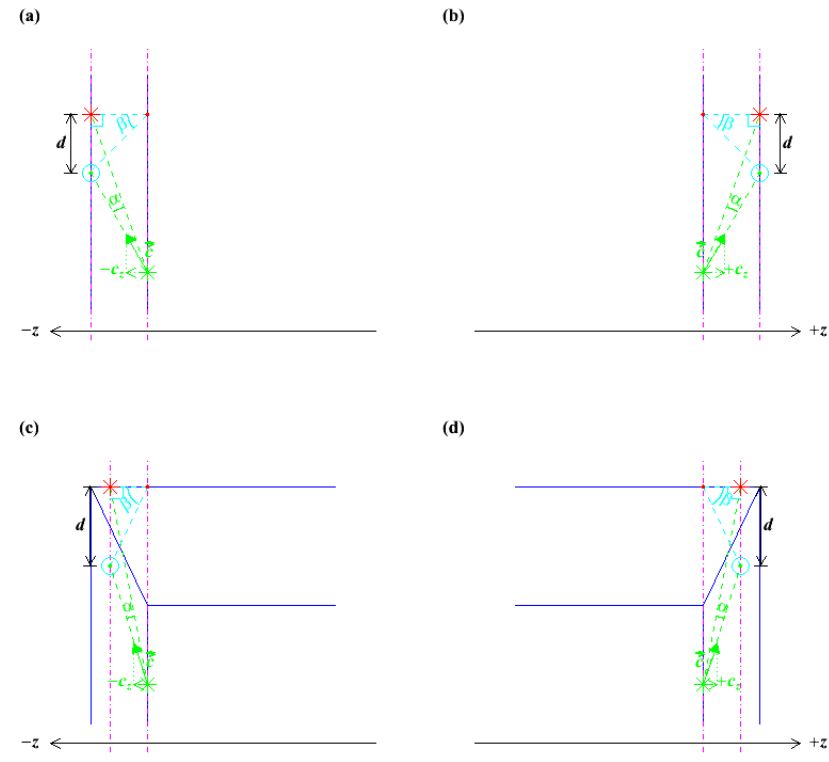
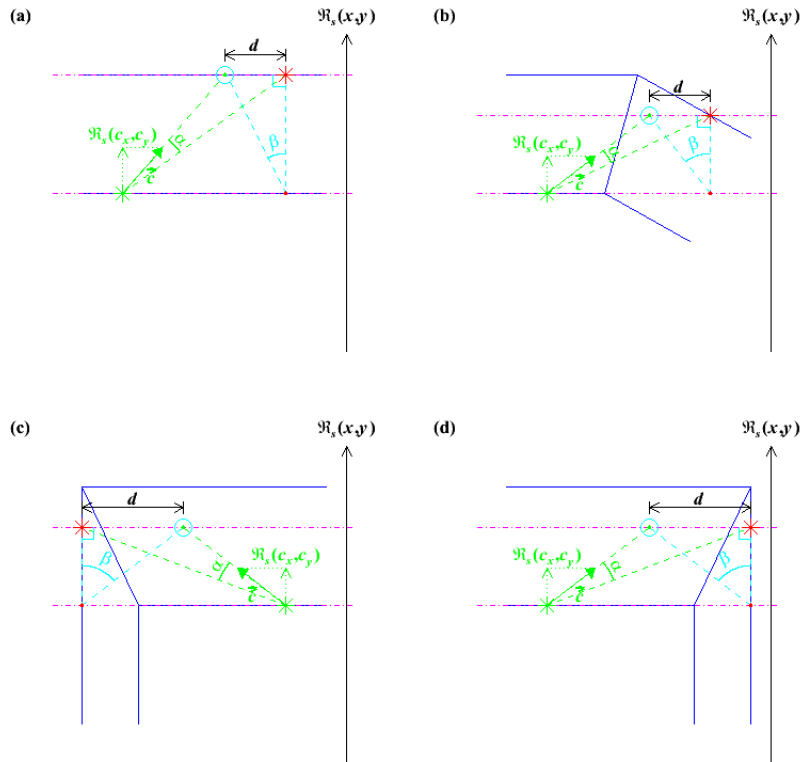
*The end*

*That's all folks...*

# Cluster-tracking between pseudolayers

From the pseudobarrel

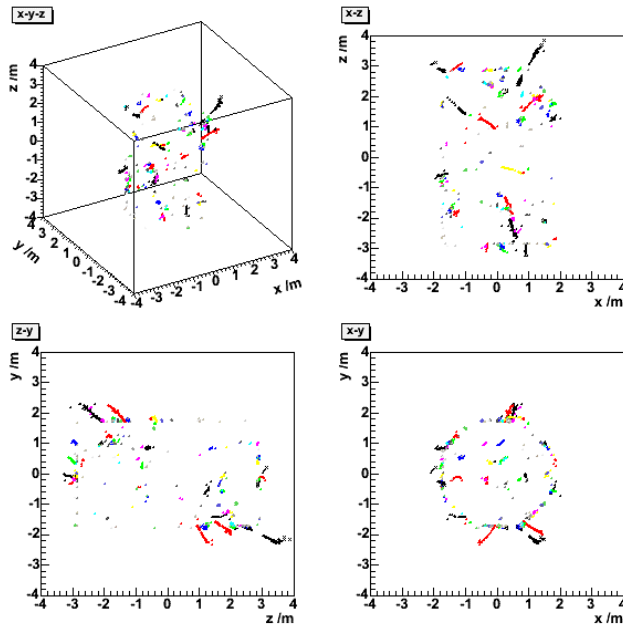
From the pseudoendcap



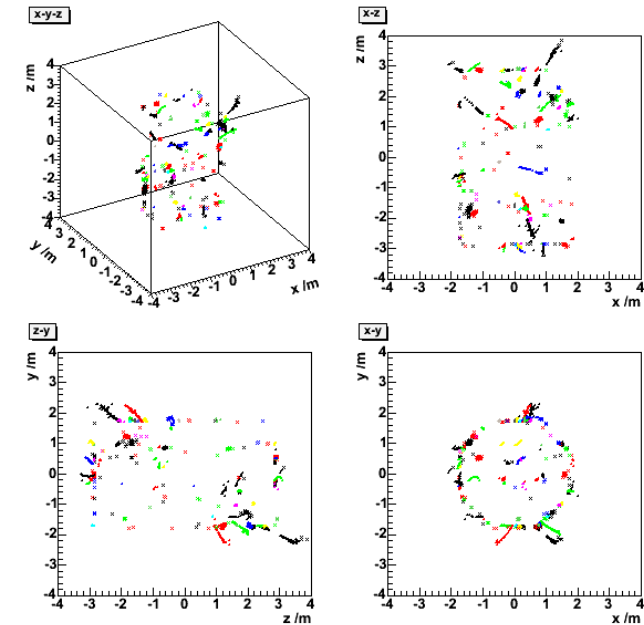


# 91 GeV $Z \rightarrow u, d, s$ jets event

## Reconstructed clusters



## True particle clusters



Distribution of event energy (%)

Reconstructed cluster ID	1	2	3	4	5
5	0	0	0	4.05435	0
4	0	0	0	0	5.93354
3	0	6.49559	0	0	0
2	0	0	7.72404	0	0
1	8.53424	0	0	0	0
True cluster ID	1	2	3	4	5

- Reconstruction in full detector (Si/W Ecal & RPC Hcal;  $1 \times 1$  cm<sup>2</sup> cells).
- `dist_max_ecal = 2.0` cm; `dist_max_hcal = 3.0` cm.
- Good 1:1 correspondence between reconstructed and true clusters (5 highest energy clusters shown).

# Calibration of $\pi^+$ , $\gamma$ and $n$

$\pi^+$

$\gamma$

$n$

