### DL-driven pattern recognition workflow in Pandora

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FD Sim/Reco Meeting





### **Overview**



- Testing application of hit-level track/shower ID to 2D clustering
- Split reconstruction into track and shower streams
- Cheat different aspects of split reconstruction
- Tuning clustering algorithms in shower stream
- New 2D clustering algorithm

### Updated pattern recognition structure

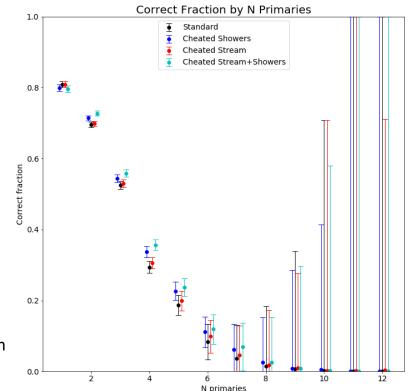


- Create initial 2D clusters
- Assign clusters to either track stream, or shower stream
- Run 2D clustering algorithms on each stream independently

| Standard                                   | Cheating                                       |  |  |
|--|--|--|--|
|  | Stream   | Shower   | Both   |
| No track/shower<br>streaming               | Cheat assignment of<br>clusters to each stream | Network assignment of<br>clusters to each stream | Cheat assignment of<br>clusters to each stream |
|  | Standard 2D clustering within each stream      | Standard 2D clustering for track stream          | Standard 2D clustering for track stream        |
|  |  | Cheated 2D clustering for shower stream          | Cheated 2D clustering for shower stream        |
| Standard reconstruction post 2D clustering | Standard reconstruction post 2D clustering     | Standard reconstruction post 2D clustering       | Standard reconstruction post 2D clustering     |

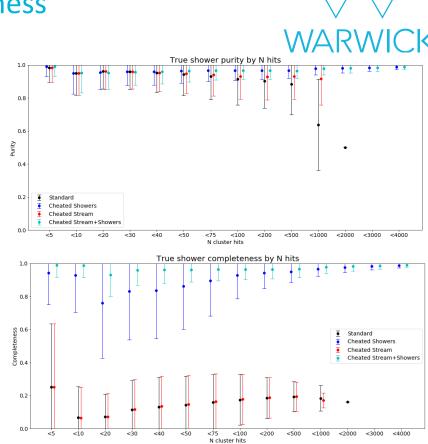
### End of reco correct fraction

- 100K events split evenly between numu and nue DUNE FD MCC11 1x2x6
- An event is deemed correct if
  - There is exactly one reconstructed particle for each MC particle
  - And those reconstructed particles must each be at least 50% pure
- Modest improvement in correct fraction for cheated cases\*
- Similar performance when cheating showers for cheated and network stream assignment
- \* Cheating only 2D clustering, yet to test cheating PFO creation in the shower stream



### **Cluster purity and completeness**

- Assess end of 2D clustering performance
- Clusters in the standard reconstruction are very pure
- Clusters in the three cheated cases are similarly pure
- Clusters in the standard reconstruction have low completeness
- Clusters in the shower reconstruction cheating cases have high completeness
  - Network stream assignment is good, but clearly still some scope for improvement

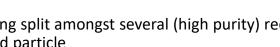


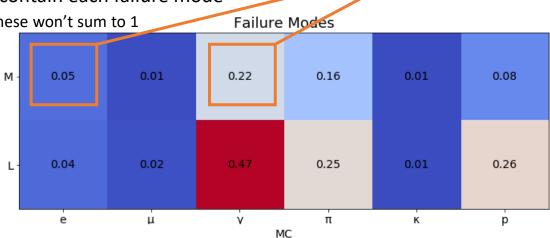
### Standard reconstruction failure modes

- Useful to identify the nature of the errors in pattern recognition
- Identify two broad categories of error
  - M: Incorrect event due to MC particle being split amongst several (high purity) reconstructed particles or having an insufficiently pure reconstructed particle Cheating is fixing these cases
  - L: Incorrect event due to an MC particle having no matching reconstructed particle

Error

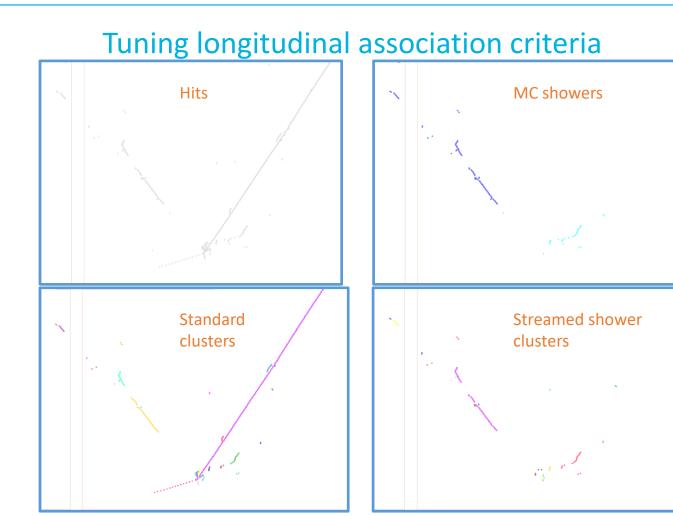
- Determine the fraction of events that contain each failure mode
  - These aren't exclusive failure modes, so these won't sum to 1
- Half of all incorrectly reconstructed events have at least one unreconstructed photon
- A quarter fail to achieve a high purity one-to-one match to at least one photon

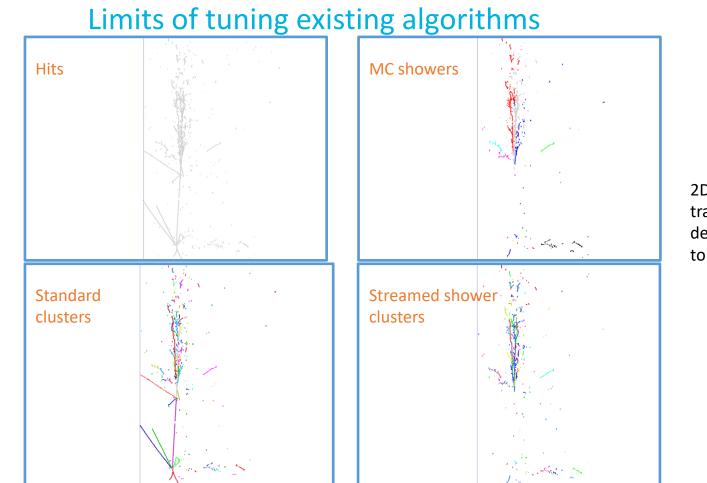




### **Tuning streamed clustering**

- Starting to look for improvements in 2D clustering of shower-like clusters
- Take advantage of the fact that we 'know' we're dealing with shower-like topologies in one of the streams
- Phase I tune the existing (track-focused) reconstruction algorithms
  - Longitudinal association and extension algorithms can be more generous in merging clusters
  - We probably don't want to split kinked clusters as readily
- Phase II introduce new algorithms to identify the topological features associated with showers



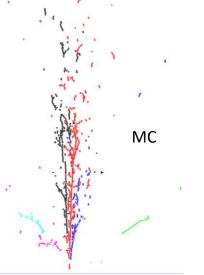


## WARWICK

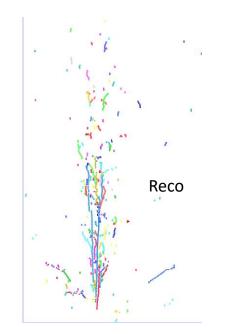
2D clustering algorithms are track-centric, they aren't designed to cope with topologies like this

### New clustering algorithm in development

- Focusing on shower induced by ~6 GeV primary pion in event from previous slide
- Each cluster represents a distinct leading shower

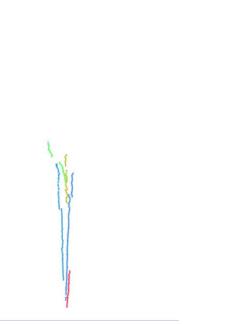


Input clusters to shower stream WARWICK



### PCA-based cluster growing

- Focus on clusters with
  > 30 hits as seeds
- Define bounding regions from PCA
- Focus on extended bounds

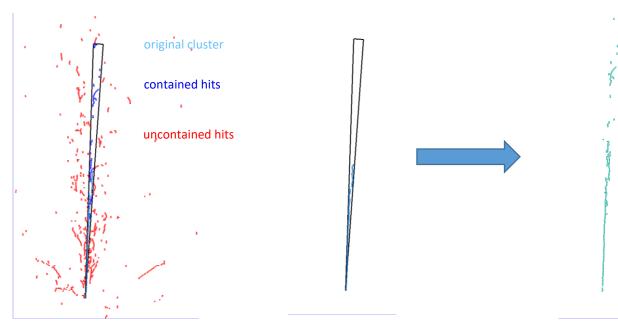


### PCA-based cluster growing

Check bounds hit intersection

• From this seed...

• We get this

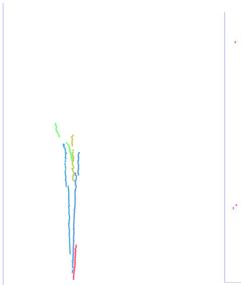


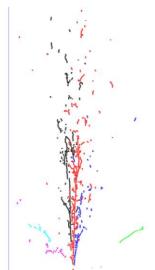
• Apply a second pass with broader transverse bounding region and no longitudinal projection...

### PCA-based cluster growing

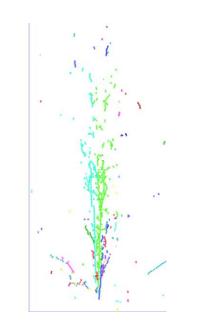
• Input seed clusters

• MC





Output clusters



#### Summary



- Scope to increase completeness of 2D shower clusters with track/shower separation into independent streams
- Increased 2D completeness can reduce event reconstruction failures caused matching multiple PFOs to a single MC particle
- Some scope to tune existing track-centric algorithms to operate in a shower environment
- Developing new algorithms to fully exploit the separation