

Water Cherenkov Detector Reconstruction Tools

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Overview

- **This talk provides an overview of my framework for reading in WCSim ROOT files and running reconstruction routines.**
- **It's just an interim framework, but provides the following:**
 - Reads in the WCSim events, geometry and truth information, and provides lookup methods for all of them.
 - Contains some simple data classes for reconstructed quantities.
 - ◇ Not a complete set of data classes or variables, but a start.
 - Has a simple framework for running reconstruction algorithms, and also some simple algorithms.
 - ◇ Not flexible, needs development. However, code works!
 - Also contains framework for event displays and output ntuples.
- **Code in SVN, and provides base for Common Reconstruction.**

<https://lbne.bnl.gov/svn/people/CommonReconstruction/WCSimAnalysis>

With apologies for unimaginative name, and lack of documentation —↑

(1) Building the Code

Instructions

- ◇ **Contains code from: AB, Matt Wetstein, Gavin Davies, Tian Xin (and others – apologies to those missed out of this list!)**
- ◇ **Dependencies: WCSim, ROOT (WCSim also depends on Geant4).**

Instructions:

(1) Check out code:

```
> svn co https://lbne.bnl.gov/svn/people/  
CommonReconstruction/WCSimAnalysis/
```

(2) Set up environment.

- Same as WCSim, but one additional environment variable needed: WCSIM variable should point to top directory of WCSim package.
- WCSimAnalysis directory has example setupWCSimAnalysis.sh

(3) Build Code

```
> make (with apologies for the inevitable compiler errors...!)
```

(4) Try Running...

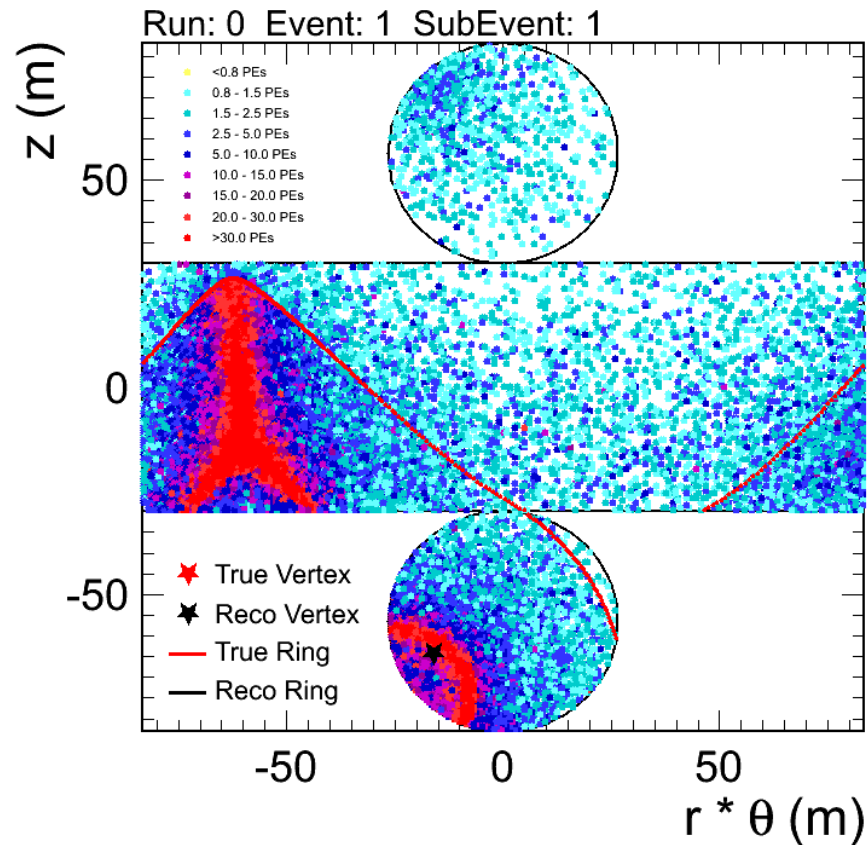
```
> root -l macros/wc_eventdisplay_3D.C
```

(5) Some examples of working code.

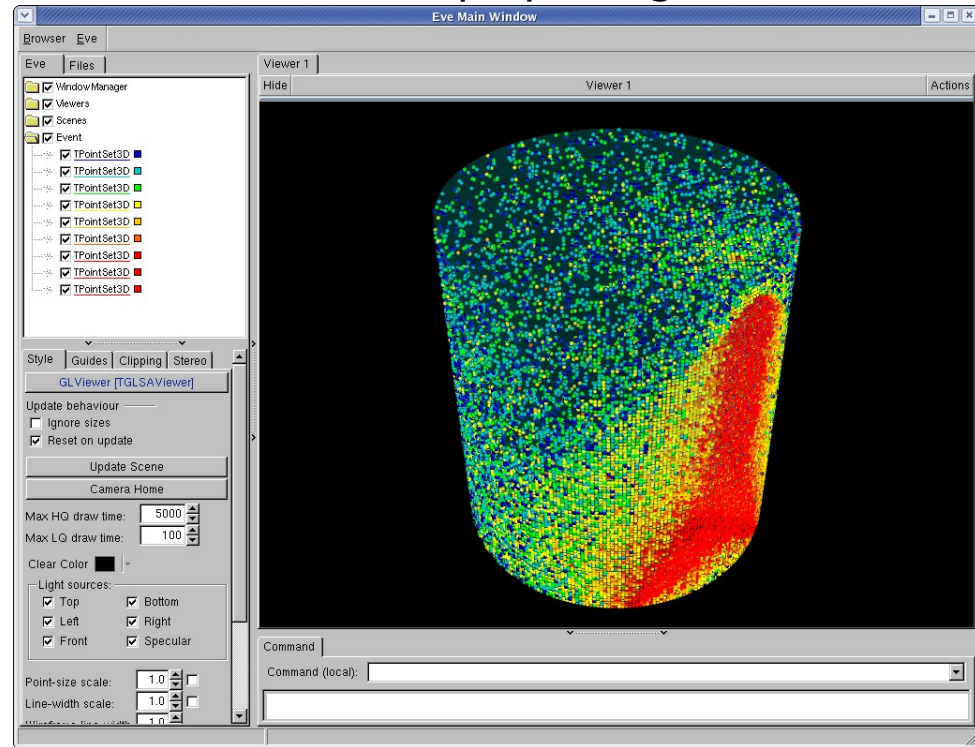
```
/lbne/app/users/trj/wcsimsoft/ OR /lbne/app/users/blake/software2010/
```

Event Displays

Example: through-going cosmic muon in 100 kton detector.

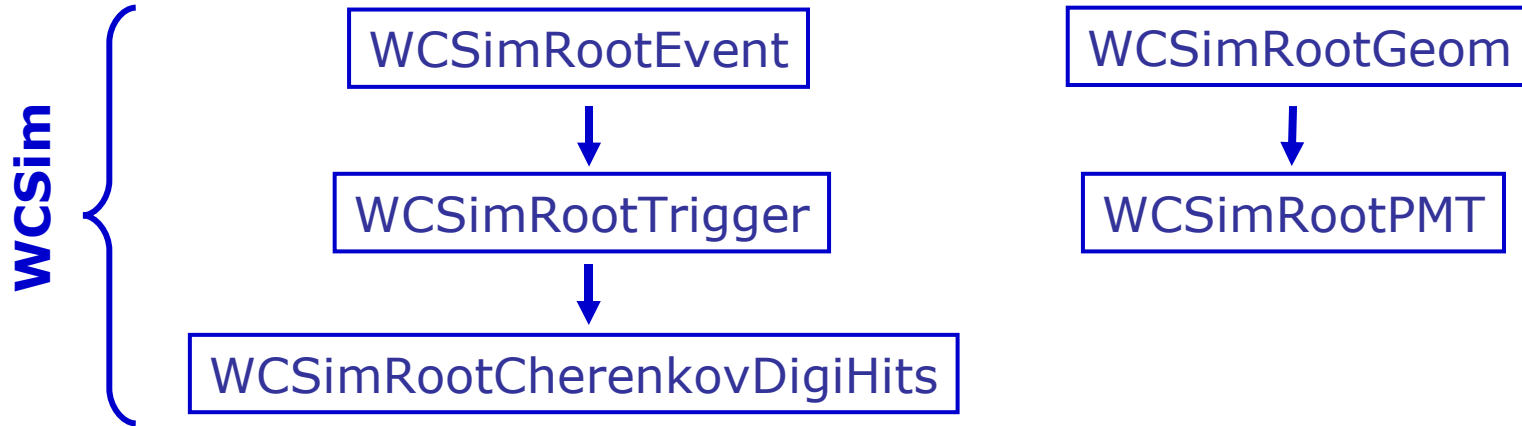


ROOT Display using TEve Classes



(2) Reconstruction Framework

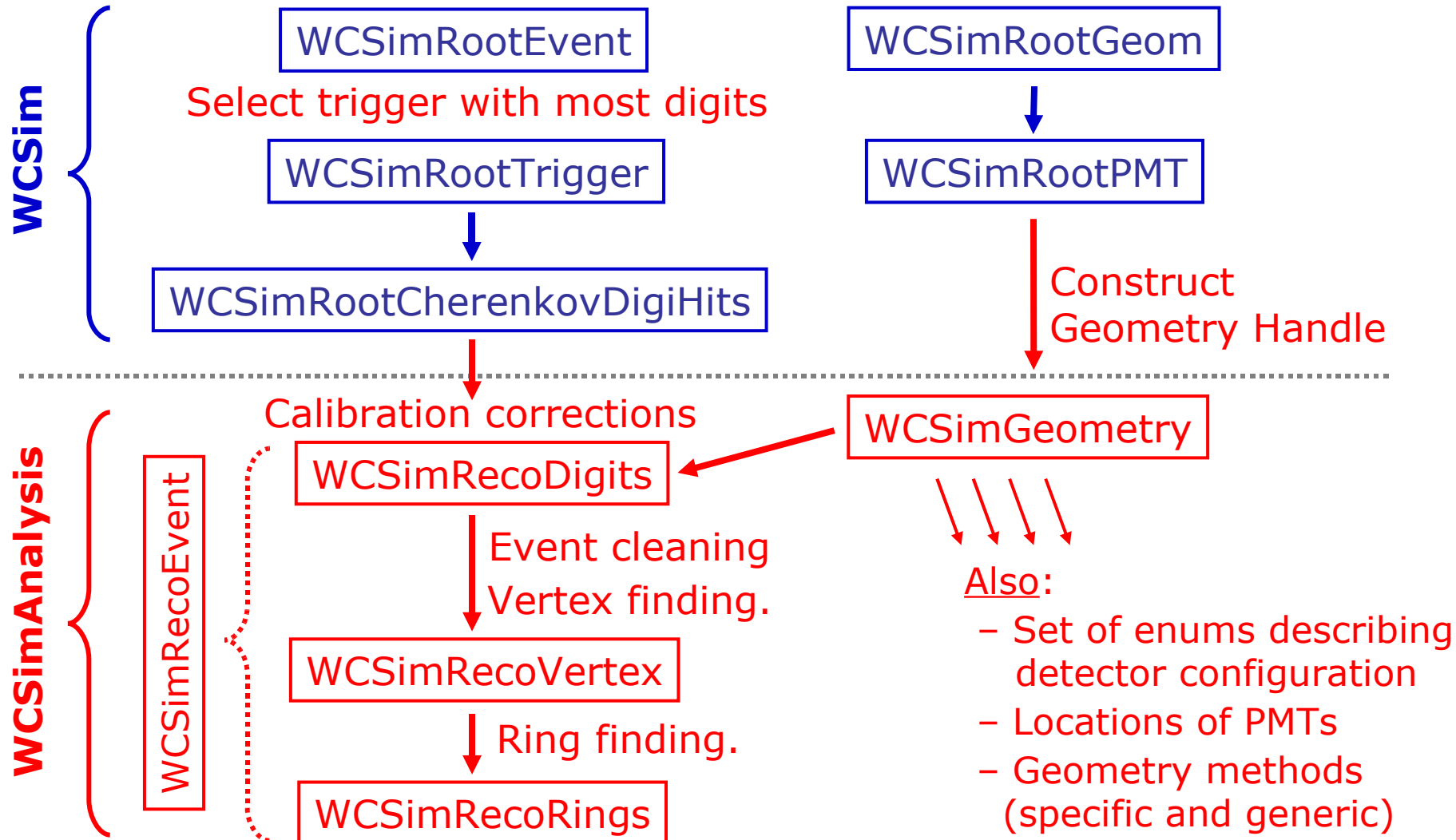
Framework for Reconstruction



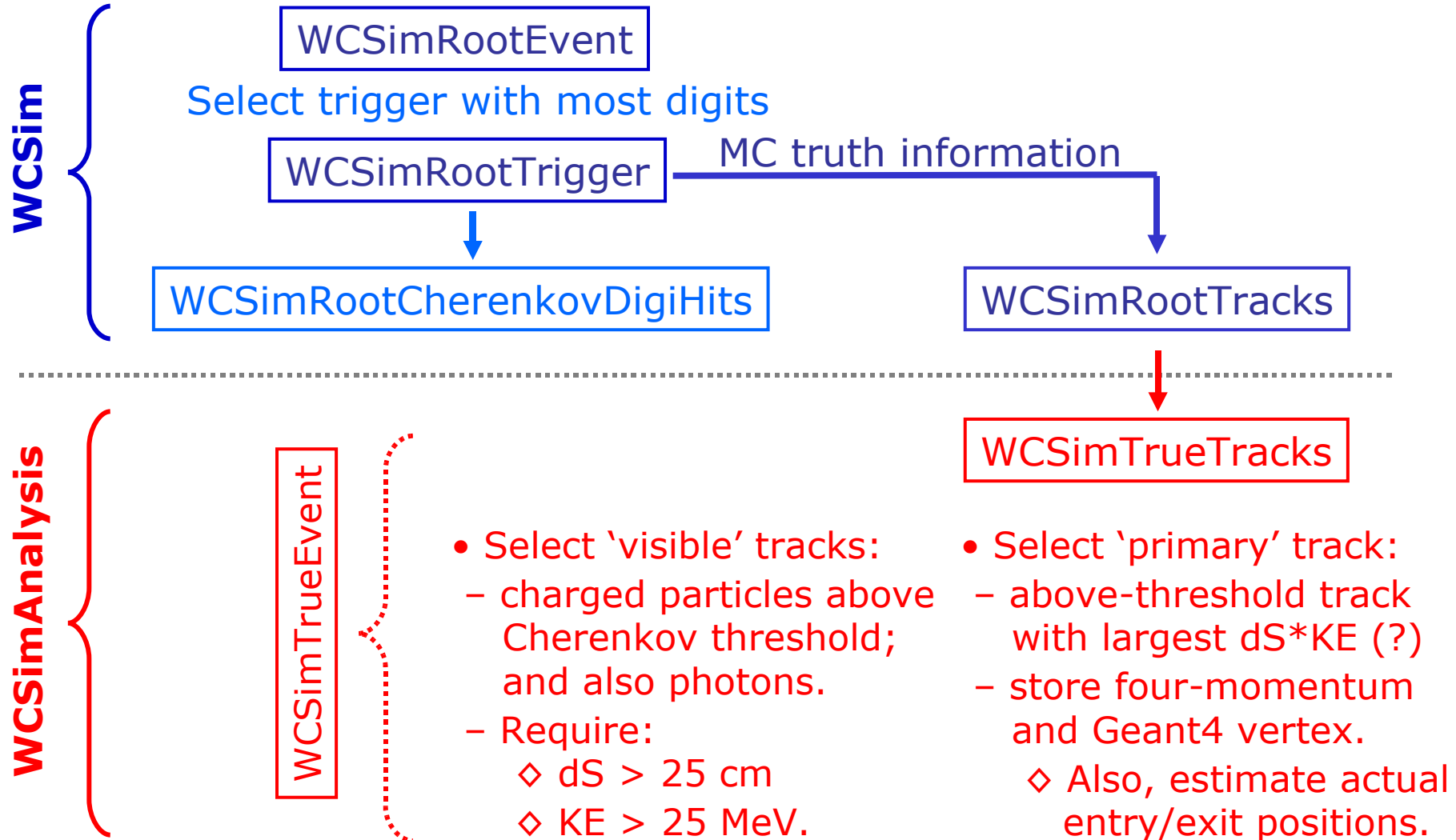
WCSimAnalysis:

- Packages information for use by reconstruction.
- Provides a set of reconstruction data classes.
- Provides framework for running algorithms.

Framework for Reconstruction



Framework for Reconstruction



Reconstruction Classes

WCSimRecoEvent

```
Int_t fRunNum;  
Int_t fEventNum;  
Int_t fTriggerNum; } Header Information  
  
std::vector<WCSimRecoDigit*> fDigitList;  
std::vector<WCSimRecoRing*> fRingList;  
  
WCSimRecoVertex fVertex;
```

WCSimRecoRing

```
Double_t fVtxX;  
Double_t fVtxY;  
Double_t fVtxZ; } Vertex  
  
Double_t fDirX;  
Double_t fDirY;  
Double_t fDirZ; } Direction  
  
Double_t fAngle;  
Double_t fHeight; } Hough Parameters
```

WCSimRecoVertex

```
Double_t fX;  
Double_t fY;  
Double_t fZ;  
Double_t fTime; } Vertex Position  
and Time  
  
Double_t fDirX;  
Double_t fDirY;  
Double_t fDirZ; } Vertex Direction  
  
Double_t fConeAngle; } Fit Parameters  
  
Double_t fFOM;  
Int_t fStatus; } Goodness of Fit
```

WCSimRecoDigit

```
Int_t fRegion; Double_t fRawTime;  
Double_t fX; Double_t fRawQPEs;  
Double_t fY; Double_t fCalTime;  
Double_t fZ; Double_t fCalQPEs;  
Bool_t fIsFiltered; } A 'Good' Digit
```

Reconstruction Classes

WCSimTrueEvent

```
Int_t fIpdg;      } PDG code of neutrino,  
                  } or primary track  
Also needs:  
    Event Type...  
    Interaction Type...  
    etc.
```

// List of Above-Threshold Tracks

```
std::vector<WCSimTrueTrack*> fTracks;
```

WCSimTrueLight

Might want to store information
from WCSim's list of photons

WCSimTrueTrack

```
Int_t fIpdg;      } PDG code  
  
Double_t fTrkP;    }  
Double_t fTrkE;    } True Kinematics  
// etc...
```

// Geant4 Vertex and End Positions

```
Double_t fG4VtxX; Double_t fG4EndX;  
Double_t fG4VtxY; Double_t fG4EndY;  
Double_t fG4VtxZ; Double_t fG4EndZ;
```

// Entry and Exit Positions in Detector

```
Double_t fVtxX;    Double_t fEndX;  
Double_t fVtxY;    Double_t fEndY;  
Double_t fVtxZ;    Double_t fEndZ;
```

```
Double_t fDirX;    }  
Double_t fDirY;    } True Direction  
Double_t fDirZ;    }
```

```
Double_t fLength;  } True Length.  
                  } Other?
```

Running Reconstruction

WCSim ROOT File ('wcsim.root')

Contains: { Event Tree: 'wcsimT'
Geometry Tree: 'wcsimGeoT'

Running WCSimAnalysis:

// Load Data

```
WCSimInterface::LoadData("wcsim.root");
```

// Initialise Reconstruction

```
WCSimReco* myReco = WCSimRecoFactory::Instance()->MakeReco();
```

// Loop over Events

```
for( Int_t i=0; i<WCSimInterface::GetNumEvents(); i++ ){
```

```
    WCSimInterface::LoadEvent(i);  // Get i'th event
```

// Build True and Reco Events

```
WCSimTrueEvent* myTrueEvent = WCSimInterface::TrueEvent();
```

```
WCSimRecoEvent* myRecoEvent = WCSimInterface::RecoEvent();
```

// Run Reconstruction

```
myReco->Run(recoEvent);
```

```
}
```

Running Reconstruction

WCSim ROOT File ('wcsim.root')

Contains: { Event Tree: 'wcsimT'
Geometry Tree: 'wcsimGeoT'

Running WCSimAnalysis:

// Load Data

```
WCSimInterface::LoadData("wcsim.root");
```

// Create Ntuple Writer

```
WCSimNtupleWriter* myWriter = new WCSimNtupleWriter();
```

// Choose Type(s) of Ntuple

```
myWriter->UseNtuple("Reco");
```

// Run over Events

```
myWriter->Run(100); // run over 100 events
```

(3) Reconstruction Algorithms

Reconstruction Tools

(1) Data 'Cleaner'

- Remove <1 PE digits. Then use clustering algorithm to remove outliers in space and time. This tags a set of 'good' digits.
- Apply overall cut on number of 'good' digits in event.

(2) Vertex Finder

- Reconstruct event vertex and direction using timing information, pulse heights of hits, and angular distribution of hits.
- Build up vertex in several stages.
 - ◇ First, find seed vertex using four-hit combinations.
 - ◇ Next, fit vertex and direction assuming point source.
 - ◇ Finally, run the fit assuming an extended source.
- Full vertex fit is 9-parameter minimisation, using Minuit (ugh!!!).
 - ◇ Position/Time (4), Direction (2), Shape parameters (3).

(3) Ring Finder

- Reconstruct single ring using 3-parameter Hough Transform.
 - ◇ Direction angles (2), Cone angle (1).

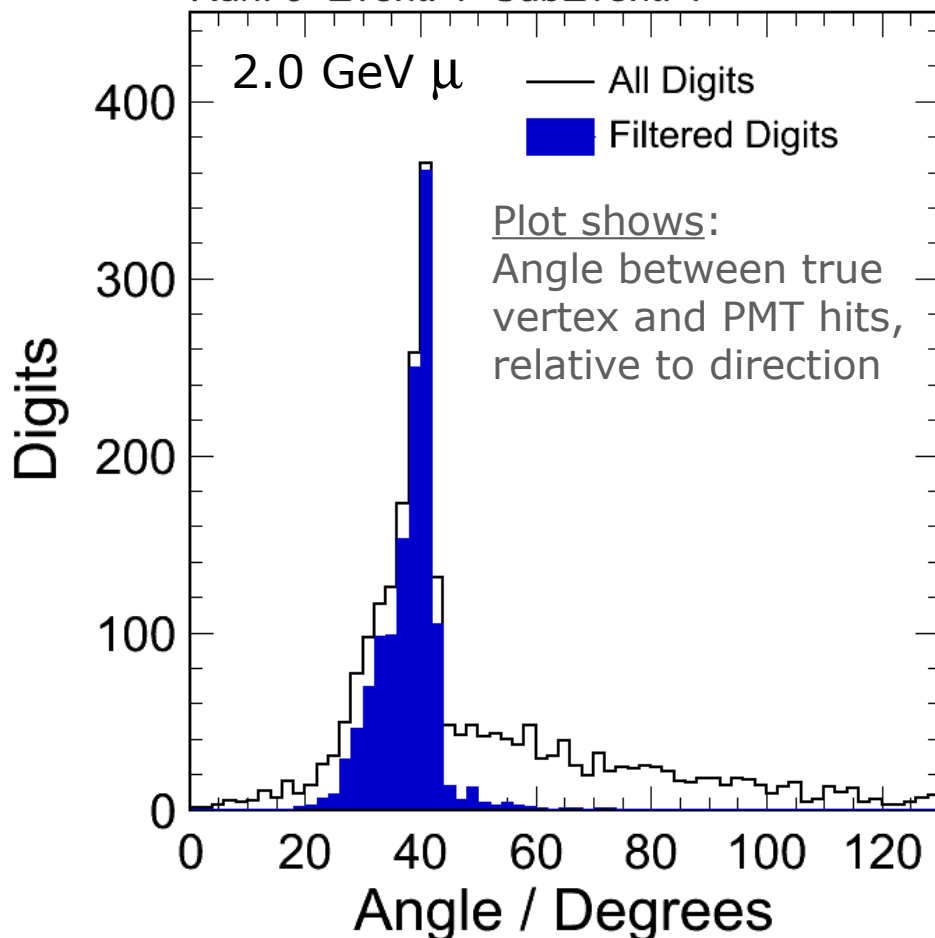
Tuning the Reconstruction

- **Each reconstruction algorithm must first be tuned using a training sample of events.**
 - Need a set of input parameterisations. These are constructed by hand, which is quite labour-intensive!
 - In general, parameterisations depend on detector geometry, event energy etc...
 - ◇ However, the code currently only supports a single set of parameterisations.
- **For the results shown here, reconstruction has been tuned using single-particle electrons and muons, for the case of 200 kton detector geometry.**
 - Samples: 1.2, 1.6, 2.0 GeV (both positives and negatives).
 - Detector: 12-inch PMTs, 10% coverage, no light collectors.
- **Would probably need to re-tune code for other samples or geometries. Would also help to bin by energy too.**
 - Need to automate the whole process somehow!!!

Data 'Cleaning'

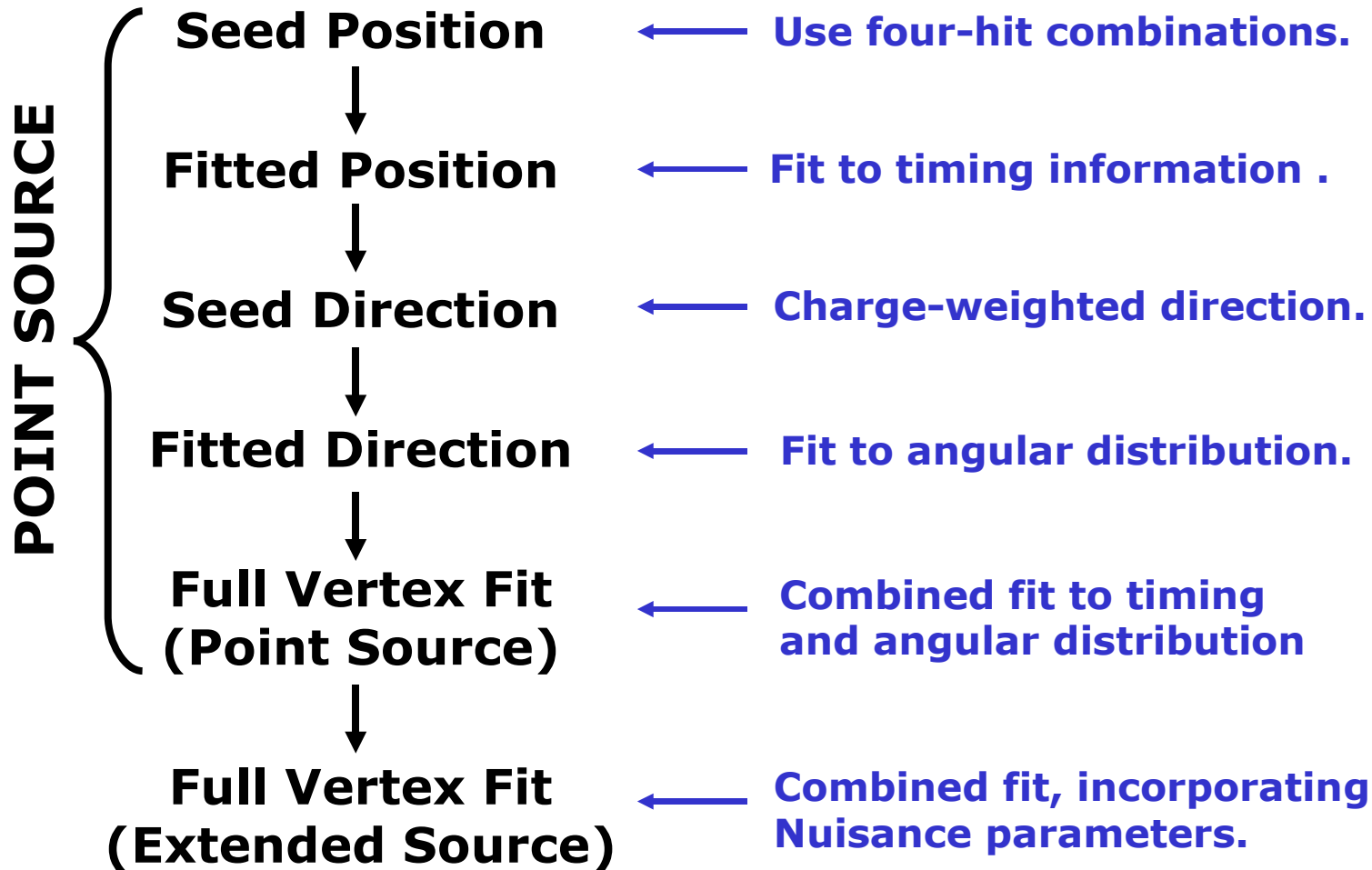
Example Event:

Run: 0 Event: 1 SubEvent: 1



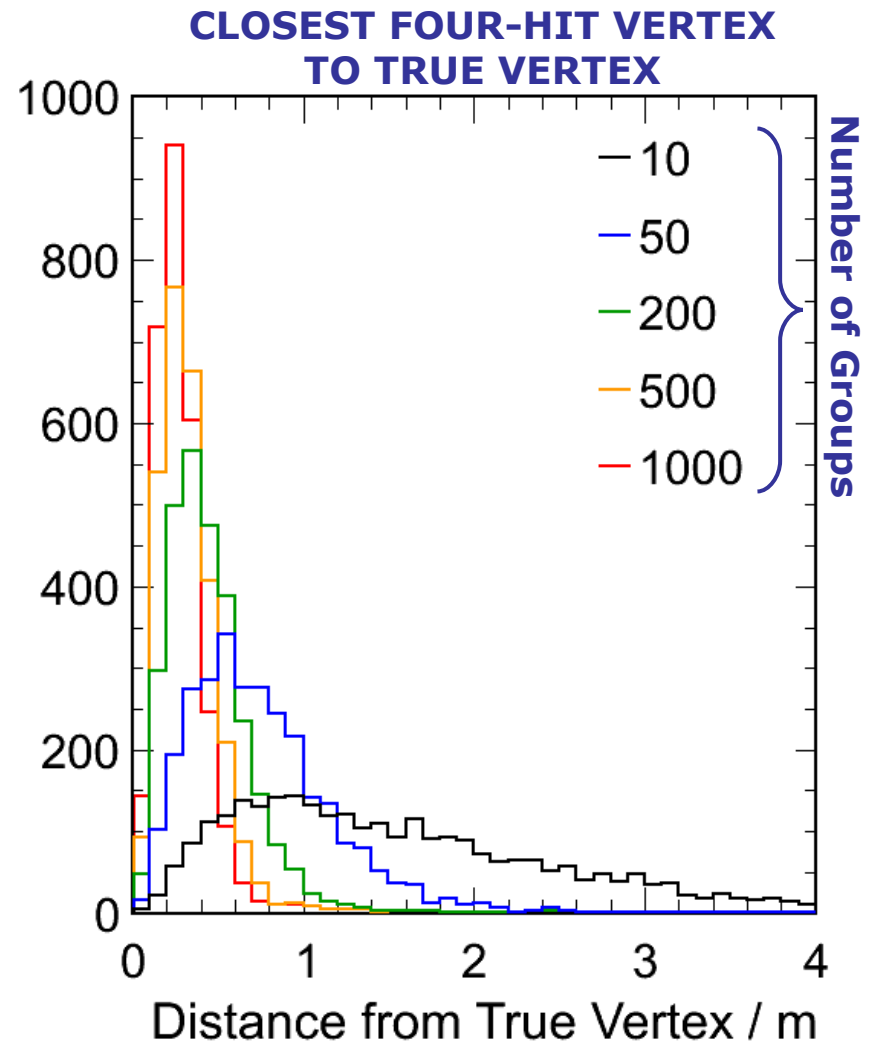
- Cherenkov rings embedded in background of late light, hampering reconstruction.
- Try to clean up events by picking out regions with highest density of hits.
- Applies following cuts:
 - Reject all <1 PE digits.
 - Select the 'good' digits.
 - ◇ These digits must have >1 neighbouring digits within 2 m and 25 ns.
 - ◇ Note: not optimised!!
 - Require >50 'good' digits.
- Pass the 'good' digits to the vertex fitter.

Vertex Fitting Algorithm



Four-Hit Combinations

- **Use four-hit combinations to seed a vertex position.**
 - Four-hit combinations have common vertex position/time.
- **Problem: Since most GeV events have >1000 digits, there are an overwhelming number of combinations!!!**
 - To reduce combinations, only use hits with >5 PEs.
 - After that, select four-hit groups pseudo-randomly.
 - Using 200 four-hit groups, one is almost always within 1m of true vertex.
 - Pick vertex position which maximum likelihood.



Likelihood Function

- **Likelihood function divided into time and spatial parts:**

$$\mathbf{L} = \prod_i \mathbf{P}_t(\mathbf{t}_i, \mathbf{q}_i) \mathbf{P}_q(\theta_i, \mathbf{q}_i)$$

- where: t_i , q_i are measured time and pulse height of i^{th} hit, θ_i is angle from vertex to i^{th} hit relative to direction.
- The pdfs $P_t(t)$ and $P_q(\theta)$ are constructed by parameterising distributions of digits, based on true vertex and direction.
 - ◊ In other words, they represent the ‘average’ event.
- However, pdfs can be adjusted on an event-by-event basis using a set of nuisance parameters.
- **Note: this isn’t a full likelihood fit...**
 - Doesn’t calculate a full hit-by-hit Monte Carlo expectation.
 - Parameterisations are constructed from final digitised hits.
 - ◊ Should really parameterise each component of simulation.
 - Use single set of functions, with no breakdown by energy etc...

Timing Residuals

- The timing part of the likelihood function, $P_t(t)$, is actually a pdf in the timing residuals.
- For point source, timing residual of each digit is given by:

$$\delta_i = \Delta t_i - \frac{\Delta r_i}{(c/n)}$$

where: Δt = displacement in time from vertex to PMT.

Δr = distance from vertex to PMT.

- For extended source, timing residual of each digit given by:

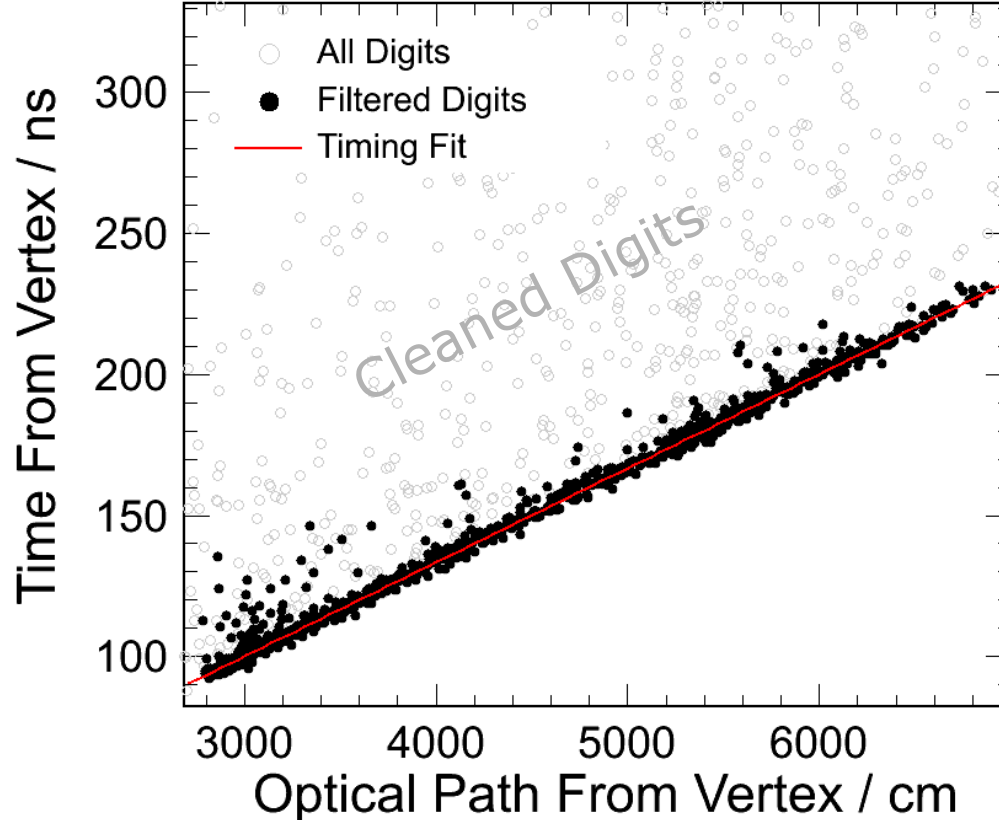
$$\delta_i = \Delta t_i - \frac{\Delta L_i}{c} - \frac{\Delta r_i}{(c/n)}$$

where: ΔL = distance along track to point of photon emission.

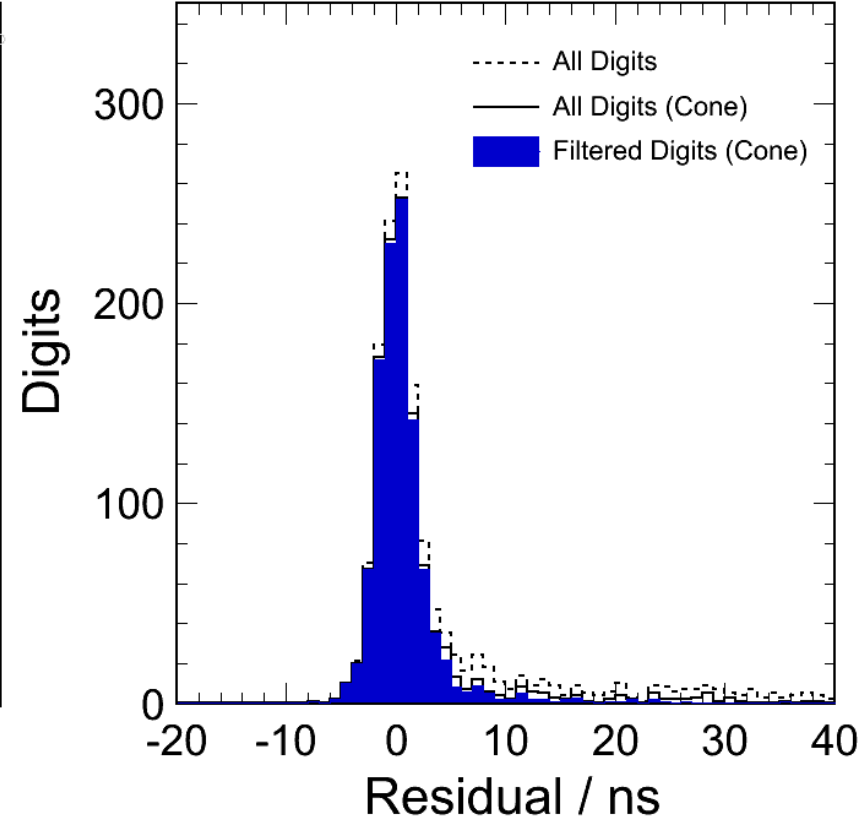
Δr = photon propagation distance to PMT.

Timing Residuals

Run: 0 Event: 2 SubEvent: 1

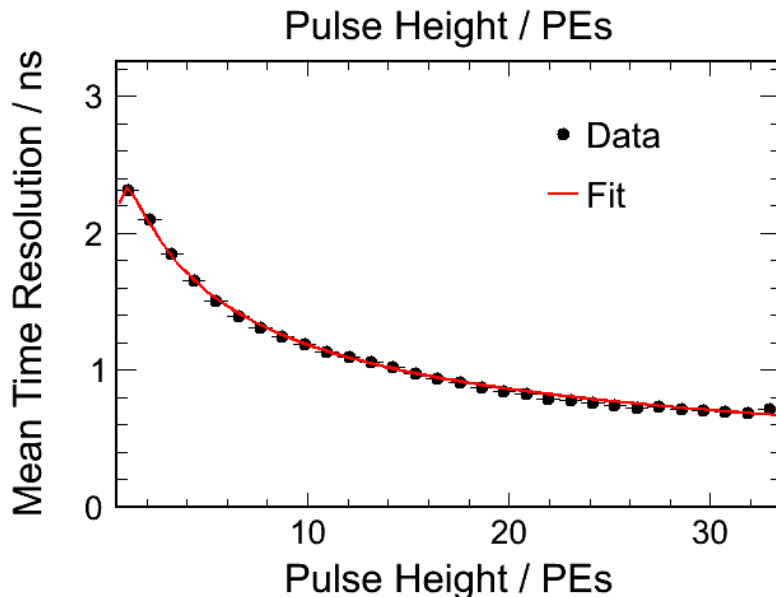
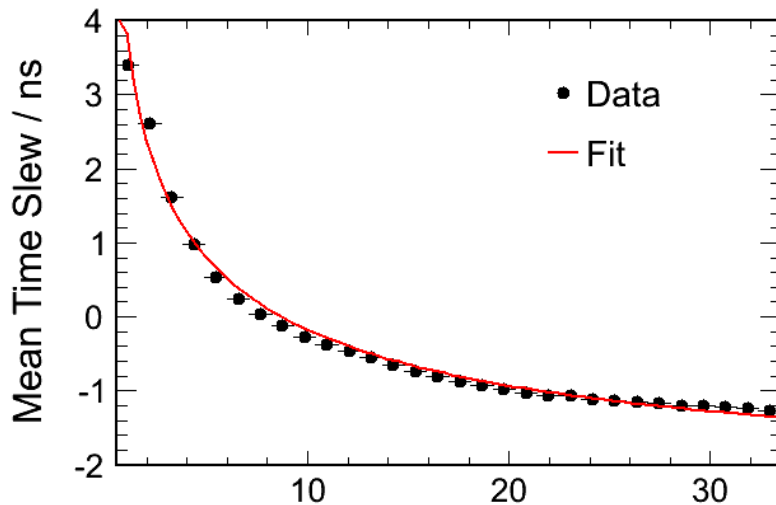


Run: 0 Event: 2 SubEvent: 1



Fit vertex position by maximizing sharpness of timing residuals.

Timing Distributions



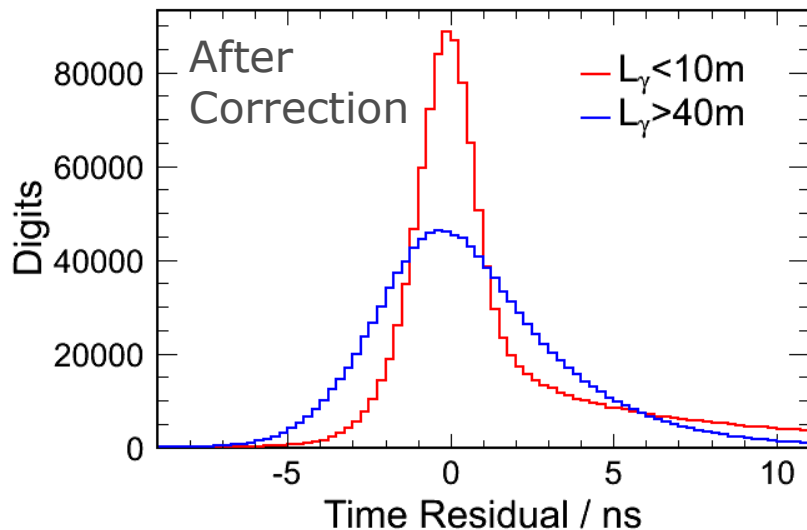
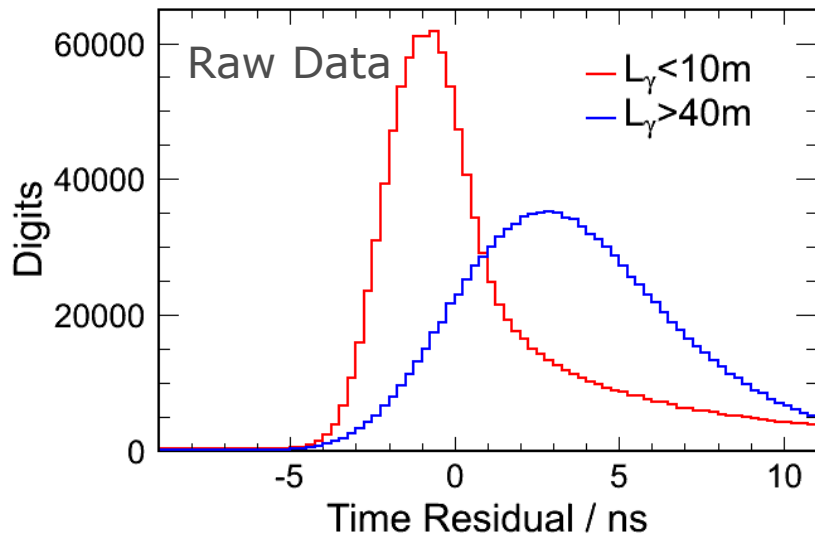
- Obtain significant improvement in vertex resolution by correcting for timewalk, and by accounting for timing resolution in the fit.
- Timewalk and timing resolution are found by calculating time residuals of those hits inside Cherenkov cone, assuming the true vertex and direction.
- Timewalk given by mean residual. Parameterise as:

$$\mu_T = c_0 + c_1 \log Q + c_2 (\log Q)^2$$

- Resolution given by rms residual. Parameterise as:

$$\sigma_T = c_0 + \frac{c_1}{\sqrt{Q}} + \frac{c_2}{Q}$$

Timing Distributions



- **Timing residuals also appear to become more delayed for longer photon propagation distances.**
 - Left plot shows time residuals for short ($<10\text{m}$) and long ($>40\text{m}$) photon propagation distances.
 - Later residuals for longer distances.
- **Correct for this effect by using an effective refractive index, parameterised as function of photon propagation distance:**
 - Use linear parameterisation:

$$n = n_0 + \alpha L_\gamma$$
 - Fit to 200kton WCSim data:
 $n_0 = 1.33$, $\alpha = 4 \times 10^{-4} \text{ m}^{-1}$.
- **I'm not sure how much of this effect is real dispersion.**

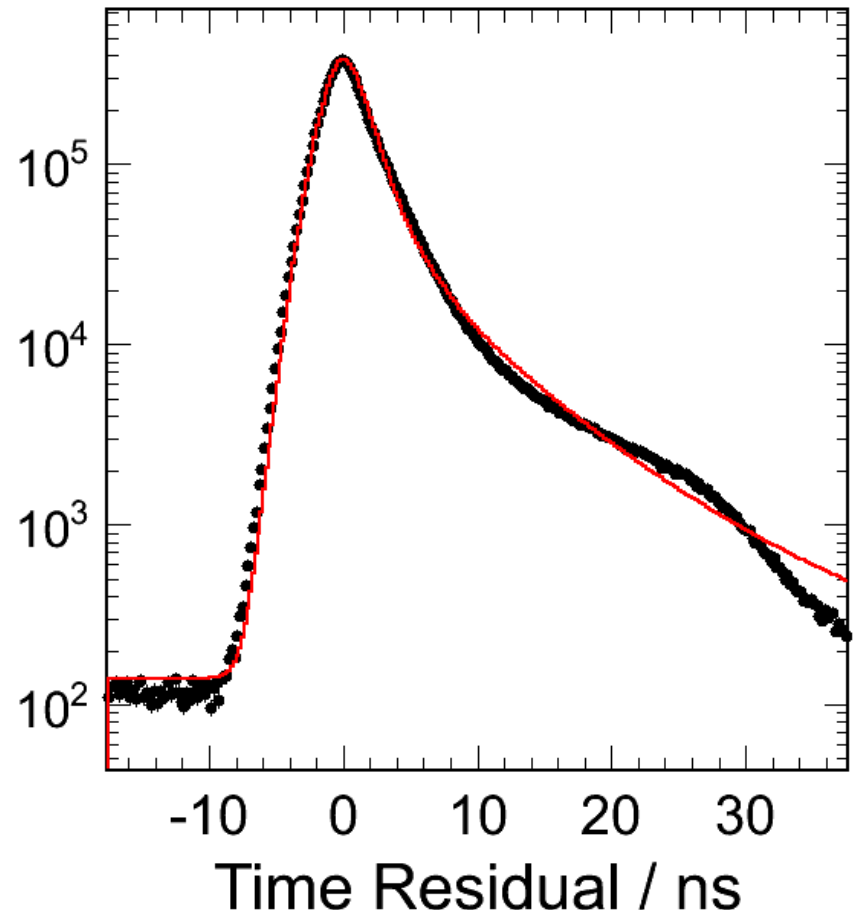
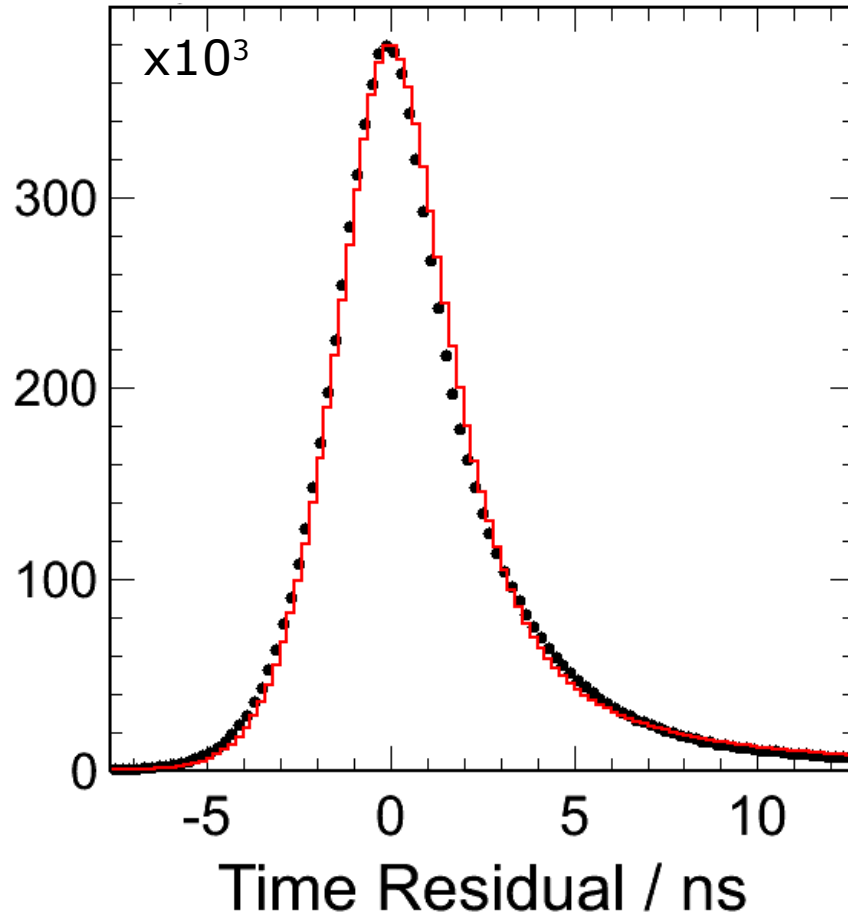
Timing Distributions

- **In likelihood function, the timing pdf $P_t(t)$ is constructed by parameterising the time residuals at the true vertex. The pdf contains the following components:**
 - (1) Use a central Gaussian distribution.
 - For each hit, width of Gaussian is adjusted as a function of pulse height (according to parameterised resolution).
 - (2) Add a double-exponential term to model late light.
 - Amplitude of term can be fitted as nuisance parameter for each event, but a constant fraction is used for now.
 - (3) Add a small constant term for other noise.

Timing Distributions

- Distribution of timing residuals at true vertex (sum of μ and e).

— Sum of timing pdfs.



Angular Distribution

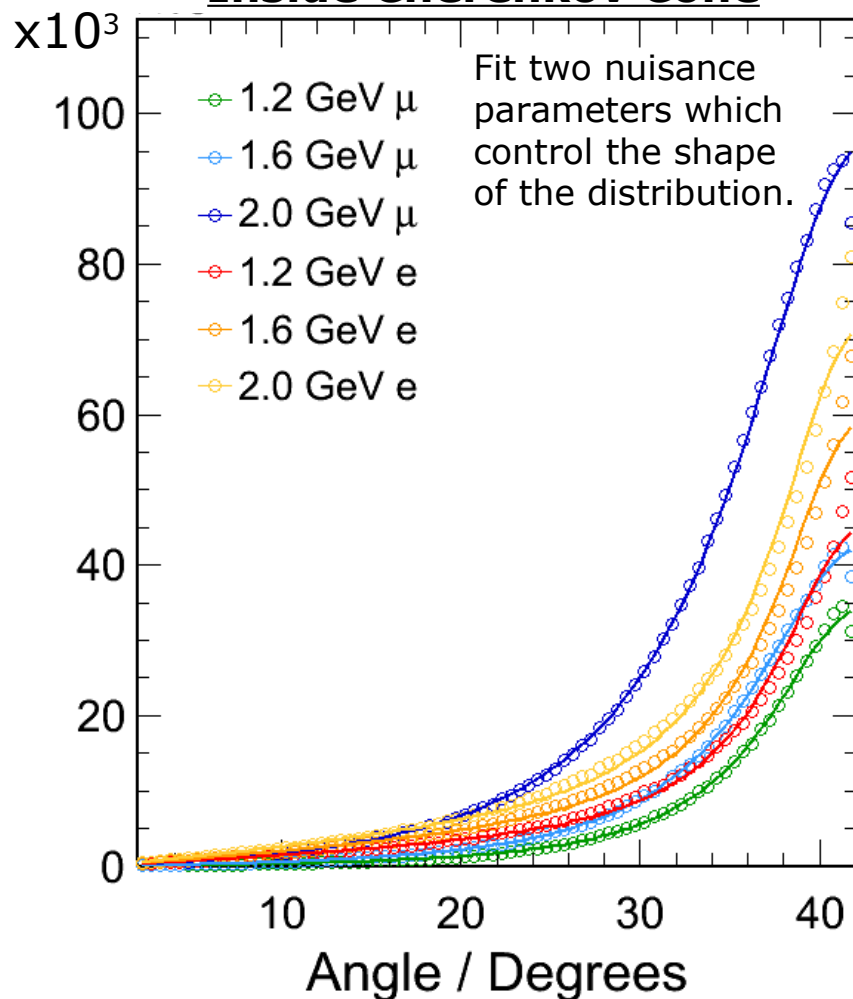
- The spatial part of the likelihood function, $P_q(\theta)$, is constructed by parameterising the angular distribution of digits, assuming a spherical (!) geometry:

$$P(\theta) = P_0 \sin(\theta) f(\theta | \alpha_0, \alpha_1, \beta)$$

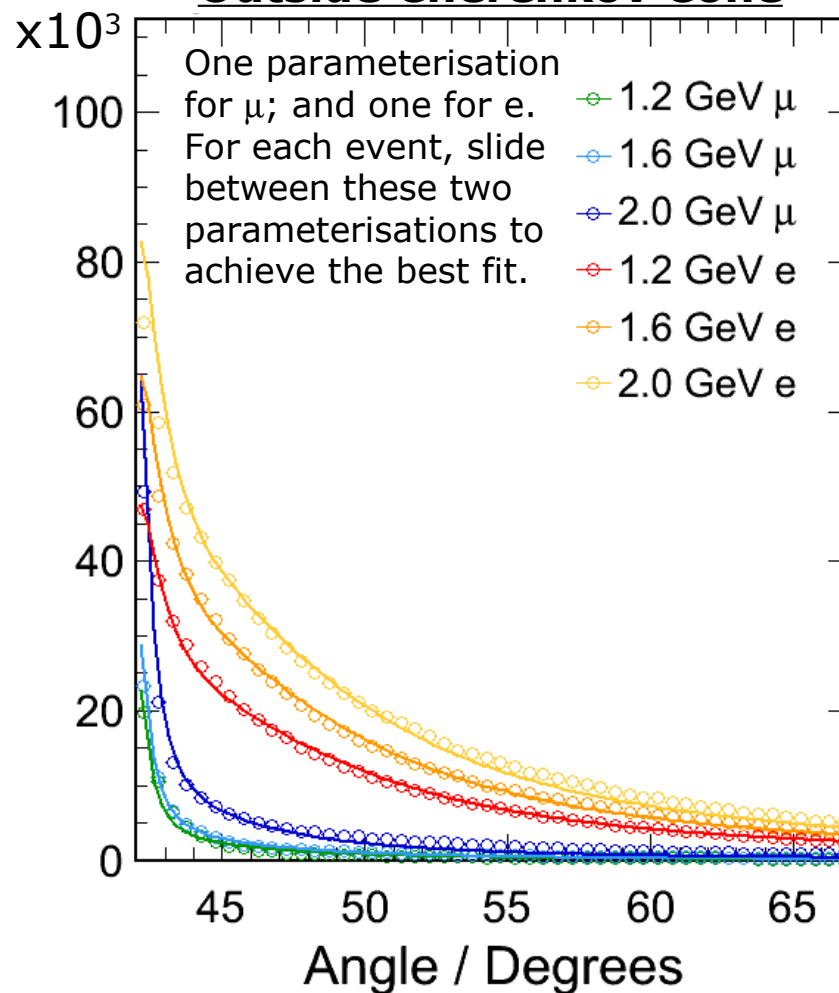
- Here, $f(\theta)$ is a function that fits the angular distribution of events.
- **Inside Cherenkov cone ($\theta < 42^\circ$):**
 - Take $f(\theta)$ to be a Lorentz function, with two shape parameters, which effectively fit the track length.
 - Fit these two shape parameters as nuisance parameters.
- **Outside Cherenkov cone ($\theta > 42^\circ$):**
 - Parameterise the average distribution of muons and electrons.
 - Fit a linear combination of these two functions to each event, with a nuisance parameter, α , giving the relative amplitude.
 - ◇ Expect: $\alpha=0$ for electrons and $\alpha=1$ for muons.

Angular Distribution

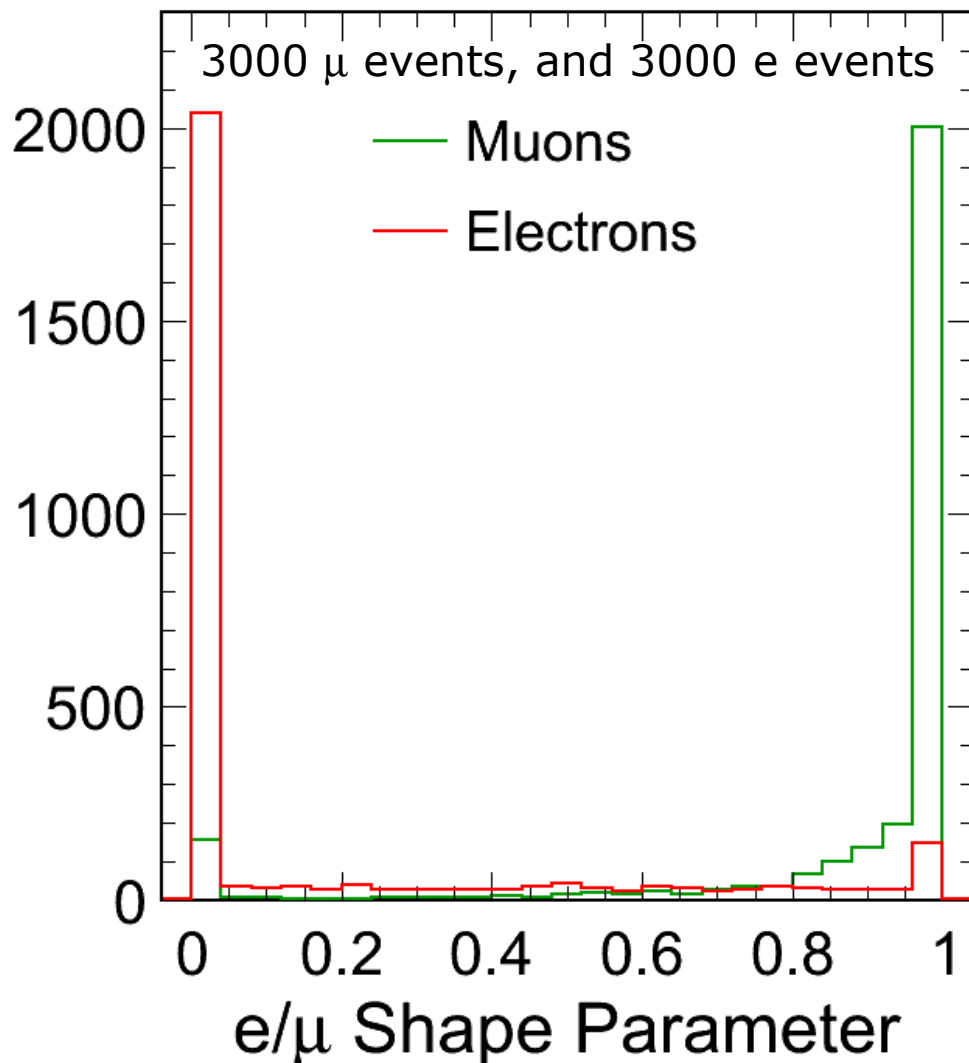
Inside Cherenkov Cone



Outside Cherenkov Cone



Electron/Muon Separation

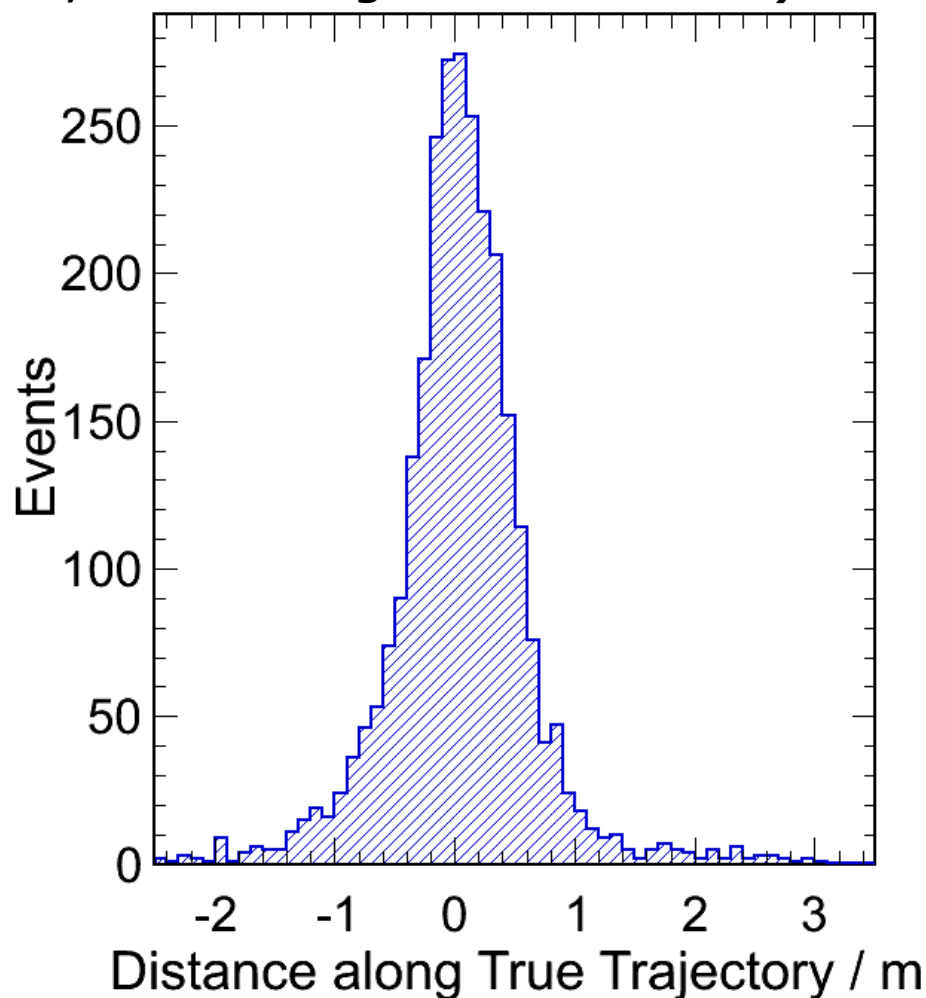
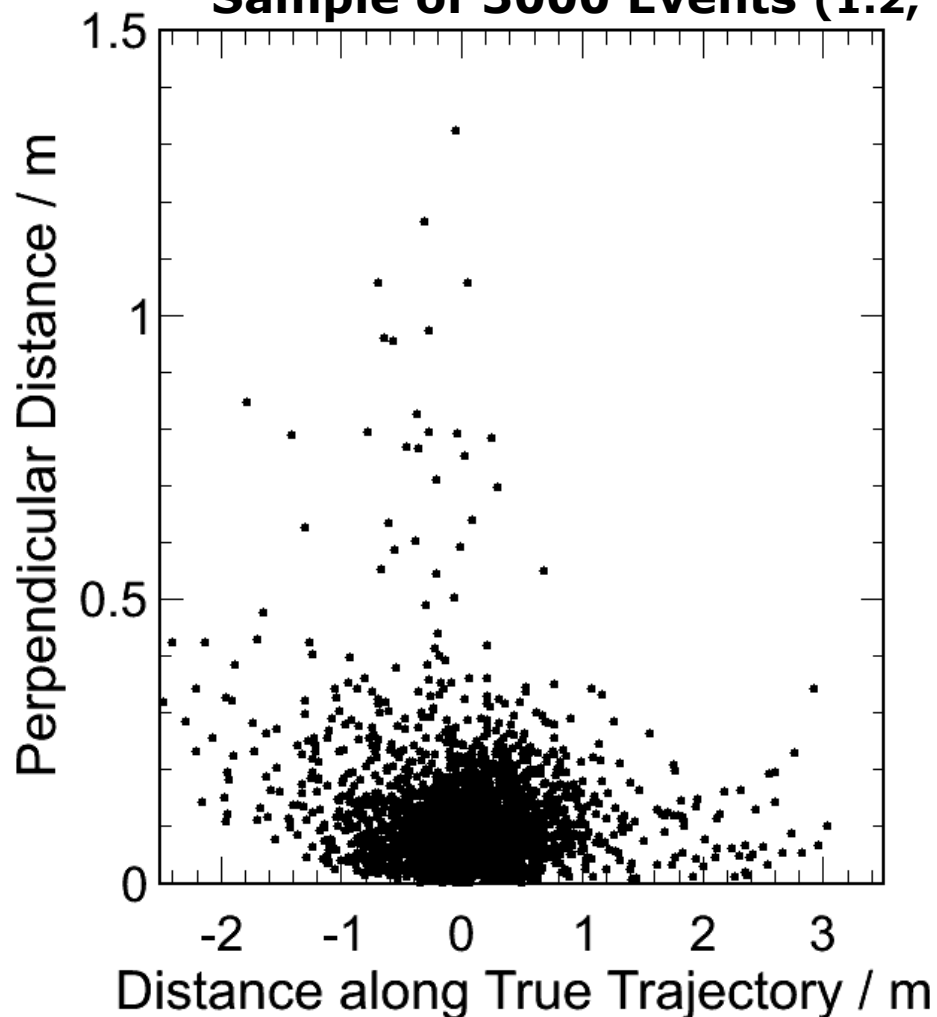


- **Outside Cherenkov cone:**

- For hits outside 42° cone, the fit slides between the parameterised templates of muons and electrons.
 - ◇ A value of $\alpha=1$ implies that muon template is the best fit.
 - ◇ A value of $\alpha=0$ implies that electron template is the best fit.
- Left plot shows that things work as they should!
 - ◇ For true μ , fitted values peak at $\alpha=1$.
 - ◇ For true e, fitted values peak at $\alpha=0$.
- Peaks have $\sim 93\%$ purity.

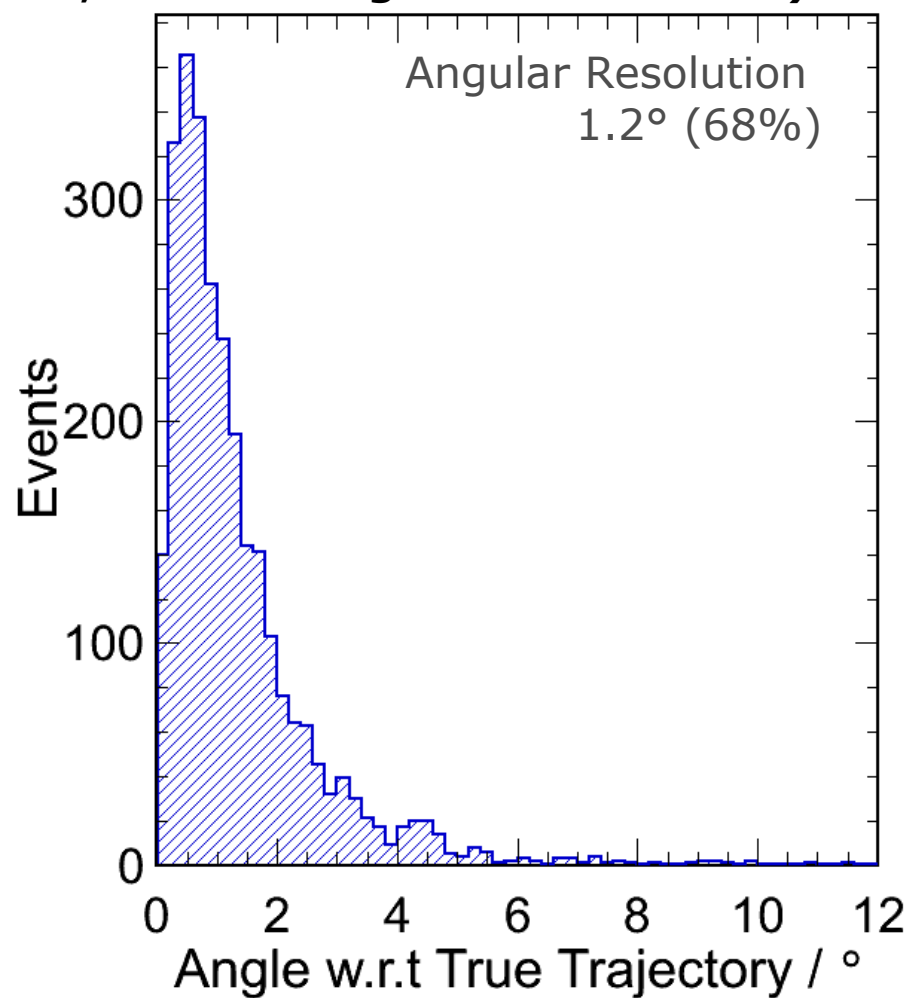
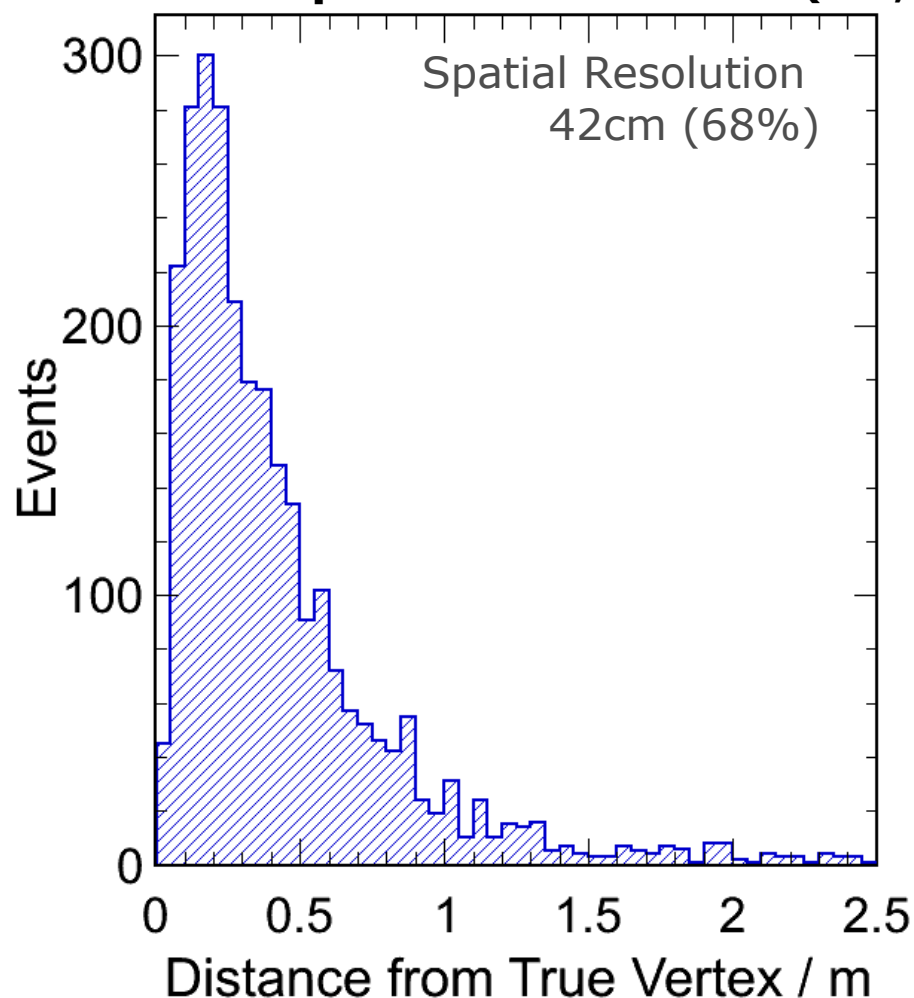
Results of Vertex Fit: Muons

Sample of 3000 Events (1.2, 1.6, 2.0 GeV Single-Particle Muons).



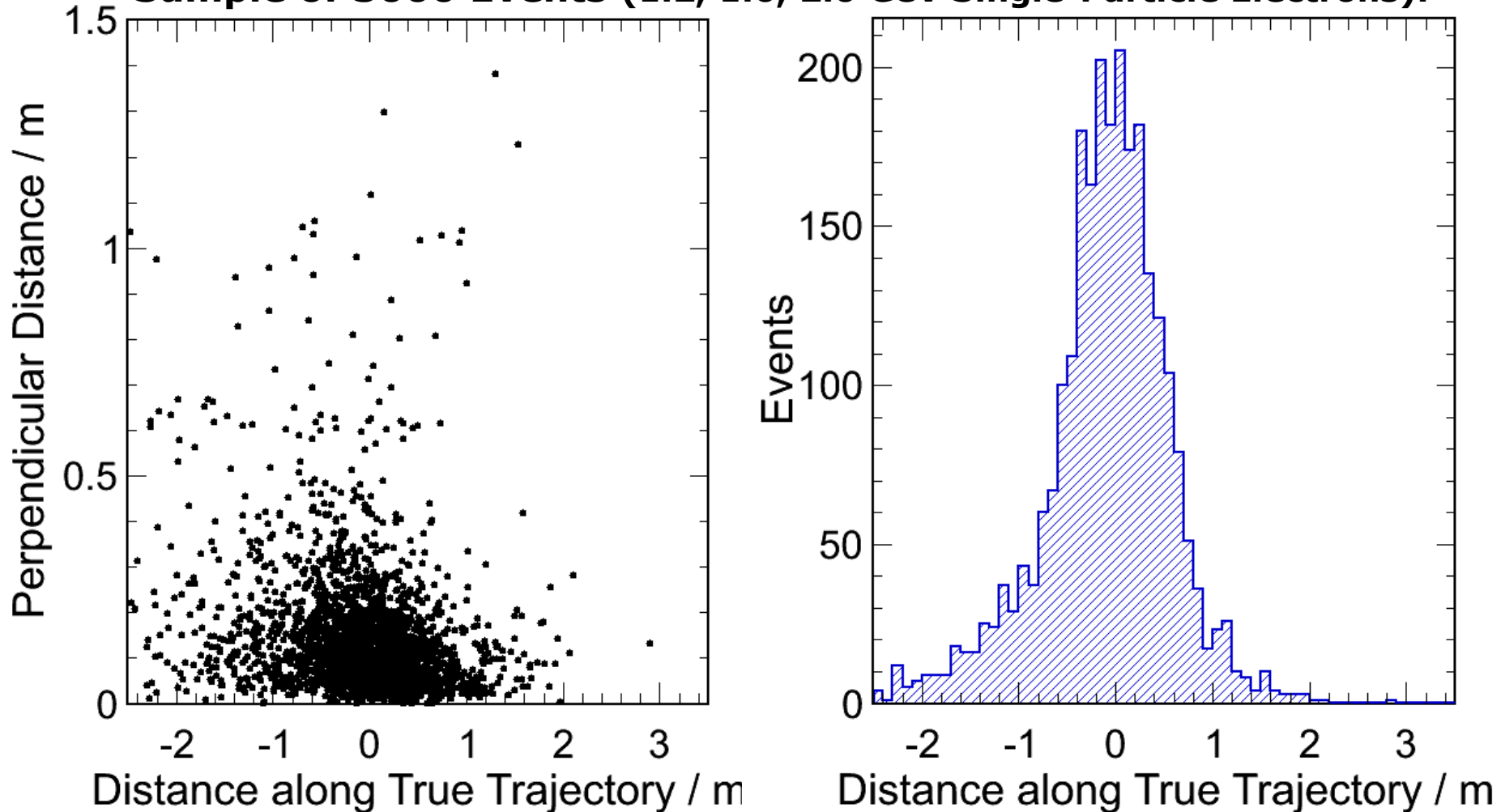
Results of Vertex Fit: Muons

Sample of 3000 Events (1.2, 1.6, 2.0 GeV Single-Particle Muons).



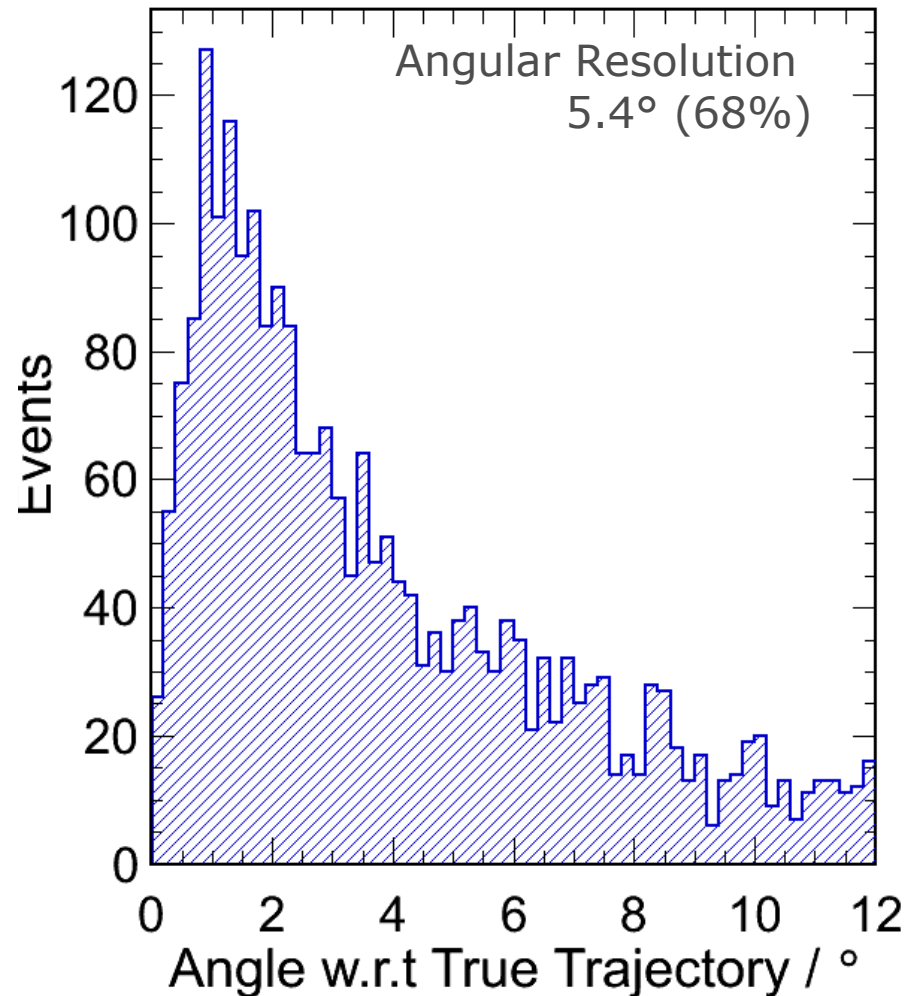
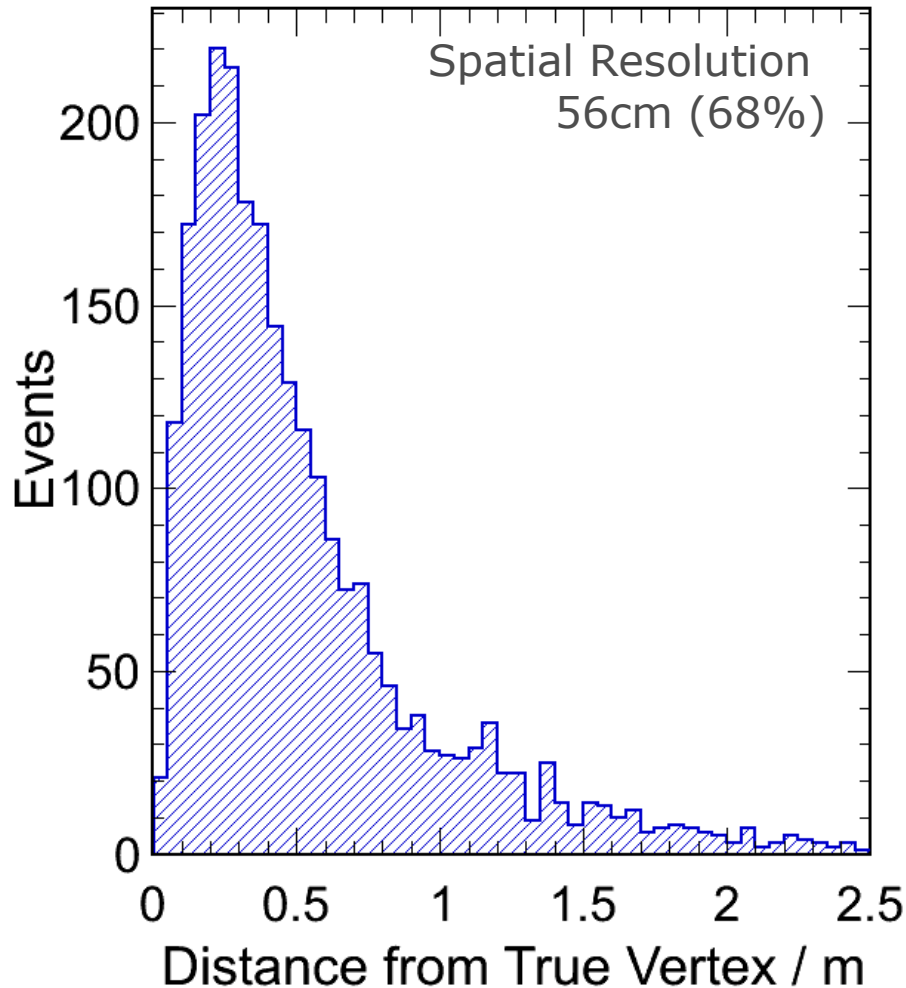
Results of Vertex Fit: Electrons

Sample of 3000 Events (1.2, 1.6, 2.0 GeV Single-Particle Electrons).



Results of Vertex Fit: Electrons

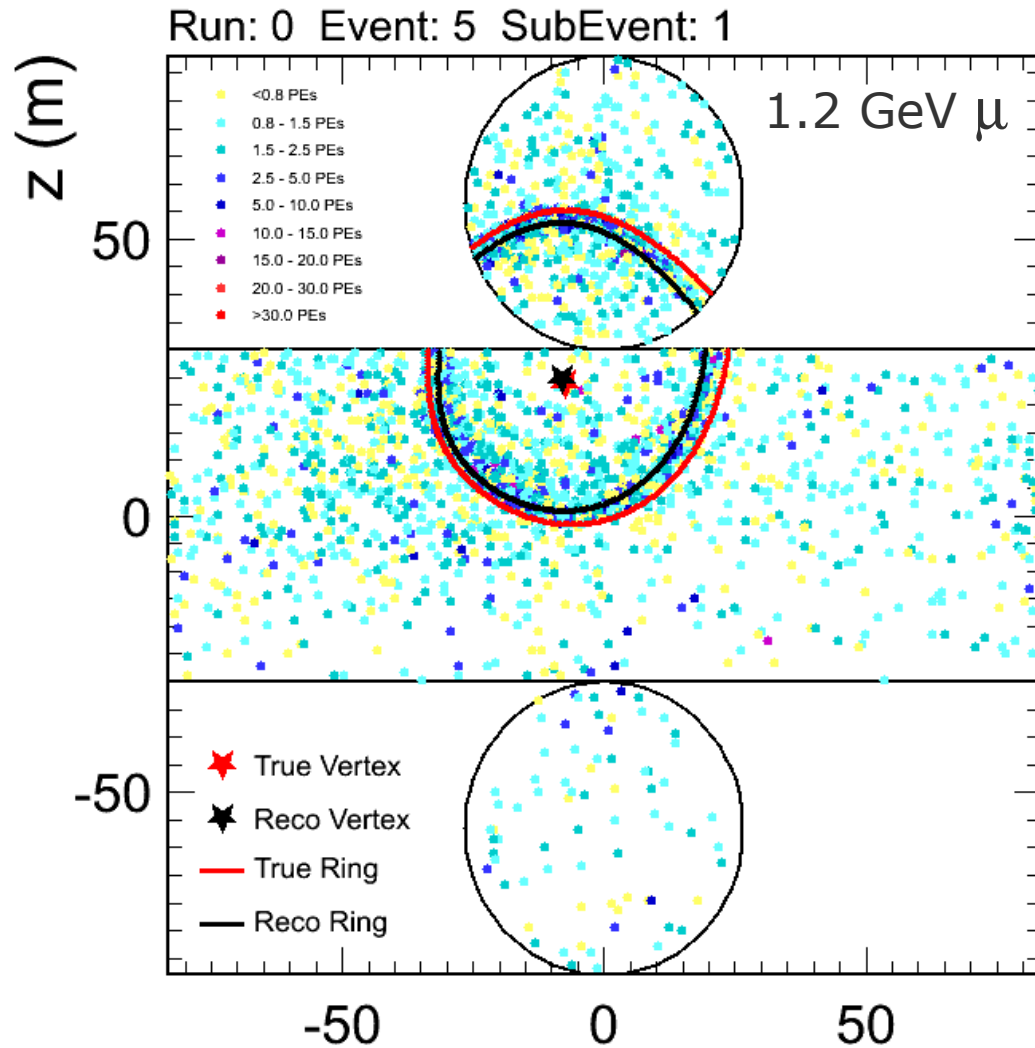
Sample of 3000 Events (1.2, 1.6, 2.0 GeV Single-Particle Electrons).



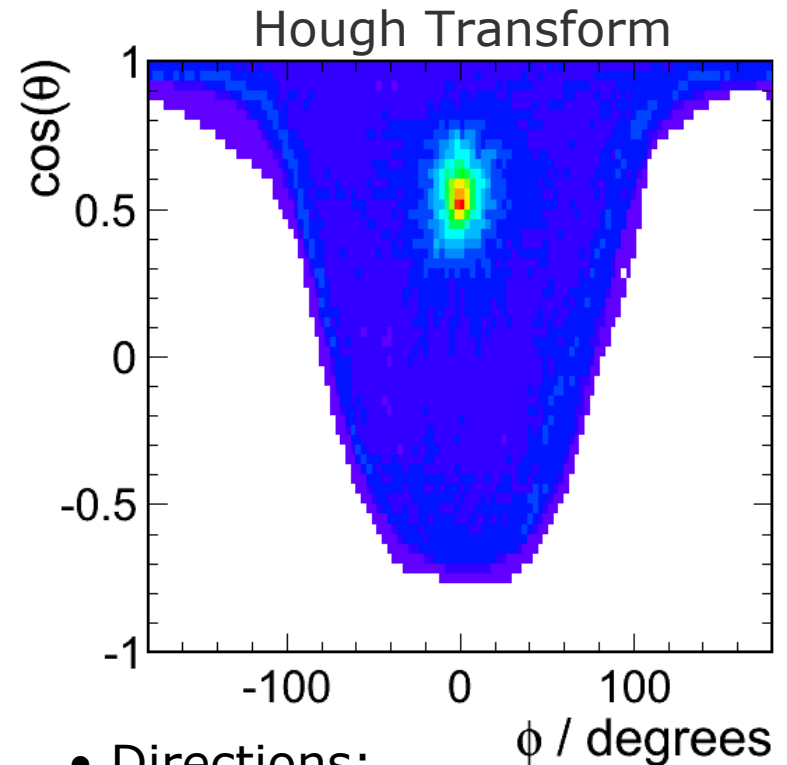
Single-Ring Finder

- **Have written a first pass ring finder. Algorithm is simple: apply Hough transform.**
 - Input reconstructed vertex.
 - Apply three-parameter Hough Transform.
 - ◇ Two direction angles (binning: 60 bins per 180 degrees).
 - ◇ Cherenkov cone angle (binning: 1 bin per degree).
 - Find position of Hough peak.
 - ◇ Take bin with maximum content.
 - ◇ Some refinement of peak position based on analysis of neighbouring bins.
 - Form a single ring.
 - ◇ Use direction and cone angle at Hough peak.
 - ◇ No further refinement of single ring.
 - ◇ No attempt to find second ring.
 - ◇ So, needs more work!

Example Event



Note: 'true' ring drawn assuming fixed cone angle of 42 degrees.



- Directions:
 - θ = zenith angle.
 - ϕ = azimuthal angle.
- Hough transform histogram shown at the cone angle with the largest peak.

Summary

- **A framework has been developed for WC reconstruction tools.**
 - Reads in the WCSim ROOT files and provides handles to digits, detector geometry, and Monte Carlo truth information.
 - Also home to a couple of event displays.
 - Contains first-pass set of data classes, along with a framework for running reconstruction algorithms.
- **Also provided are a set of simple reconstruction algorithms.**
 - Some clustering algorithms for 'cleaning' events, if necessary.
 - Vertex fitter, now tuned for the 200 kton detector geometry.
 - ◇ Uses Minuit to minimise 9-parameter likelihood function.
 - ◇ Gives vertex resolution of $\sim 50\text{cm}$ for single-particle μ and e , along with separation of μ and e with $>90\%$ purity.
 - ◇ Not a full fit. Doesn't calculate full hit-by-hit expectations.
 - ◇ Instead, analyses hits using global pdfs of timing residuals and angular distributions.
 - Three-parameter Hough transform, used to find single rings.
- **Code is in SVN, and provides base for CommonReconstruction.**