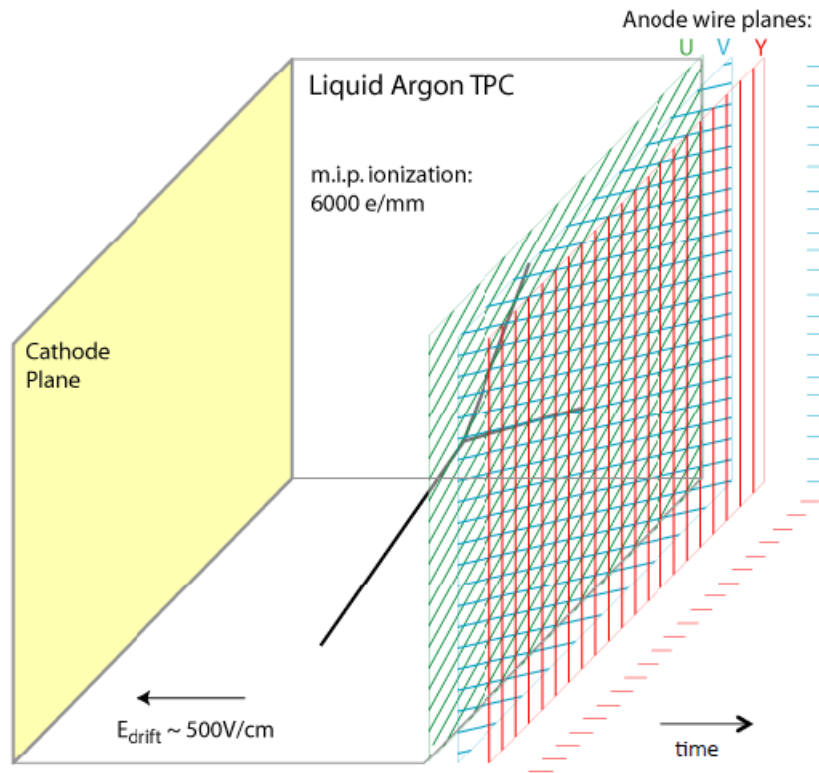


# Introduction to Wire-Cell 3D Reconstruction

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Chao Zhang  
BNL

# TPC vs. Tomography



- ❑ As electrons drift toward APA, they represent tomographic cross sections at each time slice
- ❑ Combining the reconstructed images on the time slices results in the full 3D object

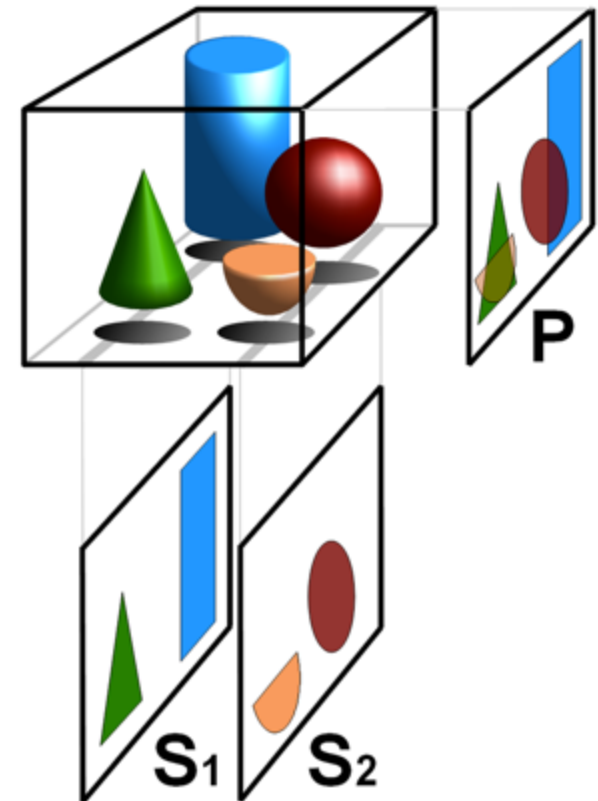


Fig.1: Basic principle of tomography: superposition free tomographic cross sections S1 and S2 compared with the projected image P

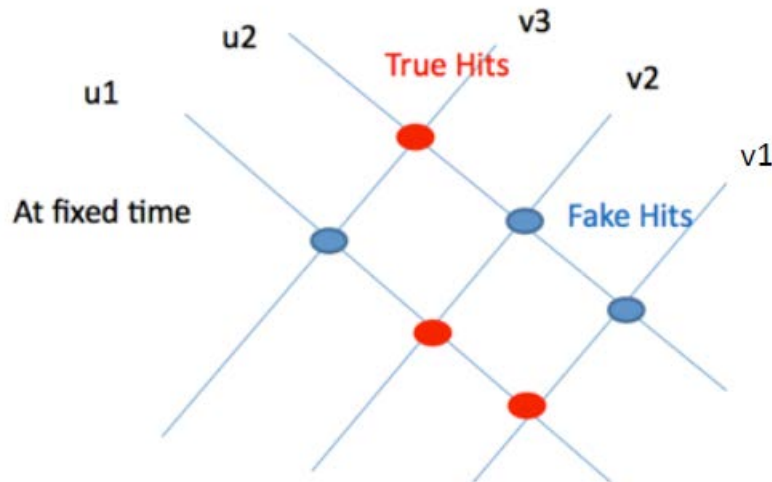
<https://en.wikipedia.org/wiki/Tomography>

# Challenges in Tomographic Reconstruction

- ❑ The tomographic view seems to be natural way to do 3D reconstruction
  - Many people thought about it, but gave up eventually
- ❑ The challenge comes from the **wire readout** (compared with the pad pixel readout)
  - Wire readout is necessary to reduce cost
  - However the measured information is reduced from  $N^2$  (pixels) to  $3N$  (wires)
    - Information lost -> **exponential degeneracy** -> give up

# An Illustration

Use two planes as an example



3 true hits



5 measurements ( $2U + 3V$  wires)

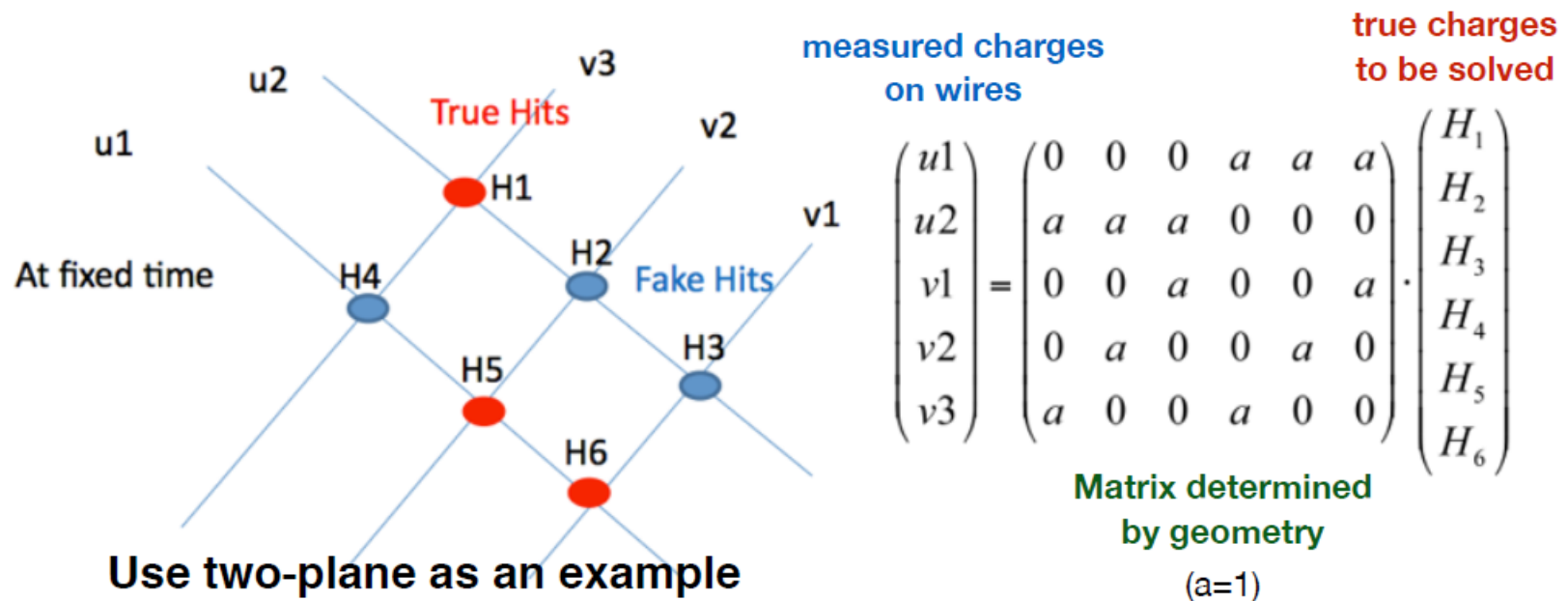


6 possible hits (3 true + 3 fake)  
 $2^6$  combinations (some can be removed from the 5-wire constraint)

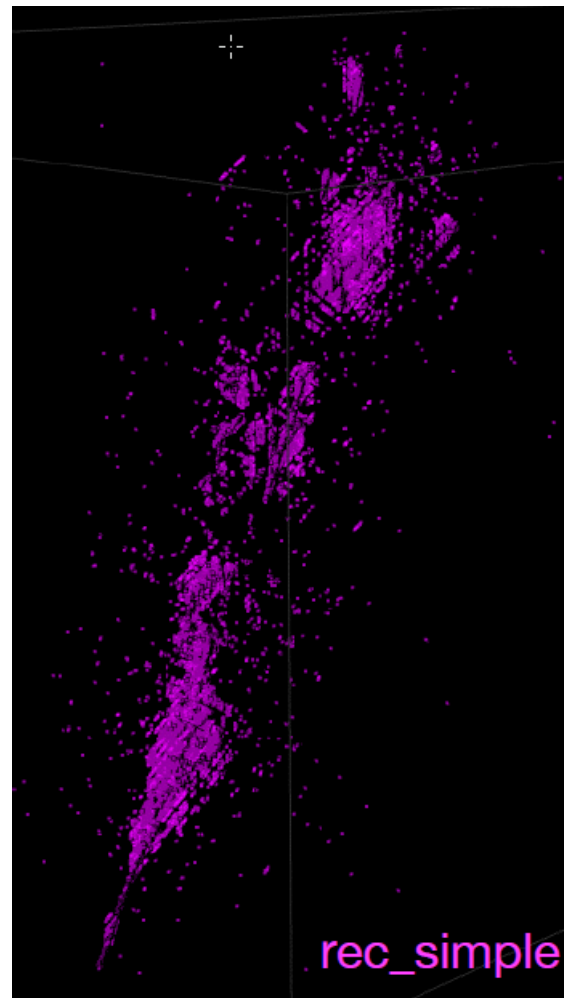
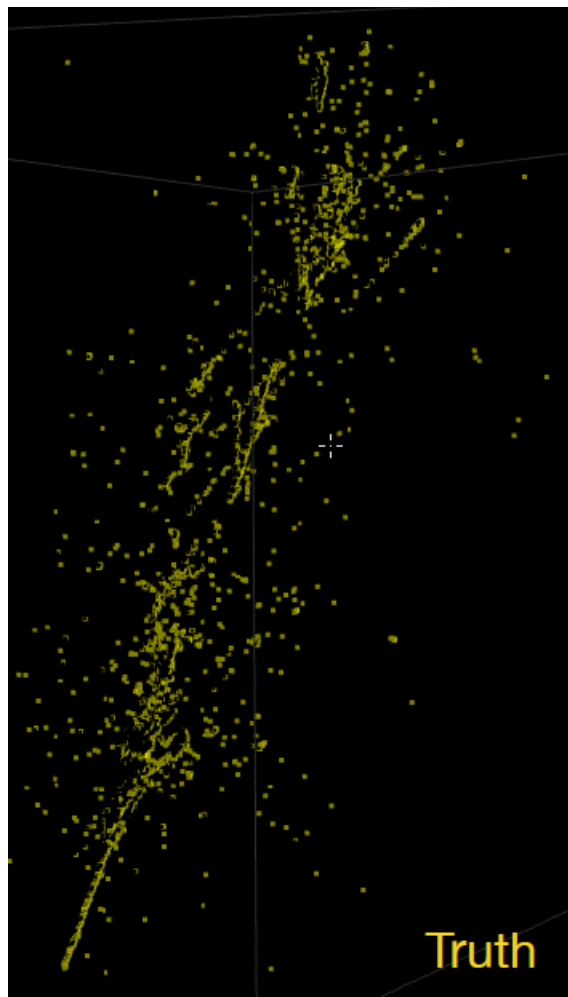
- ❑ Fake hits when there are many hits at fixed time
- ❑ Degeneracy increase exponentially with number of hits
  - Need additional information to reduce degeneracy

# New Input From Charge Information

- ❑ Same charge in a voxel is measured 3 times by wires on the three wire planes
  - Assumption: charge calibrations are good on all three wire planes
- ❑ Write down the charge matrix equations
  - If equations can be solved, fake charge will be close to zero



# Example: a 1.5 GeV electron



Use only geometry  
information



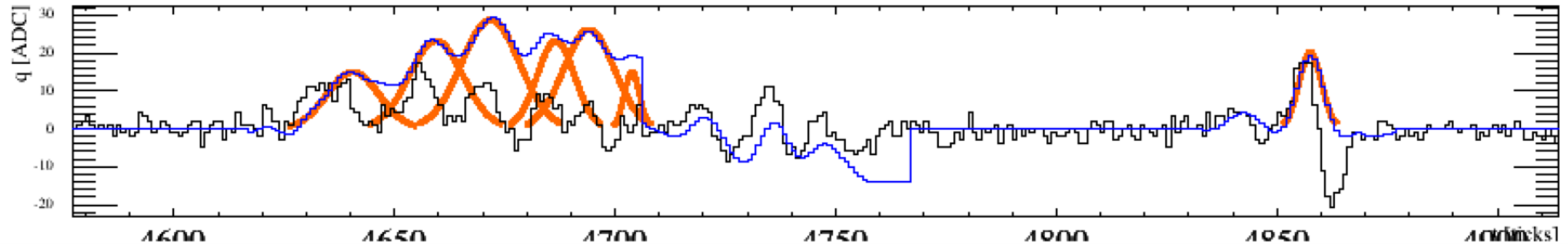
Use geometry and  
charge information

# “Wire-Cell” Reconstruction

- 1) Form time slices
- 2) Construct Wire-Cell association
- 3) Merge adjacent cells into “blobs”
- 4) Construct  $\chi^2$  through matrix equations
- 5)  $\chi^2$  minimization
- 6) Obtain best matched 3D space points

# Definition of Time Slice

Signal Processing, Jyoti Joshi

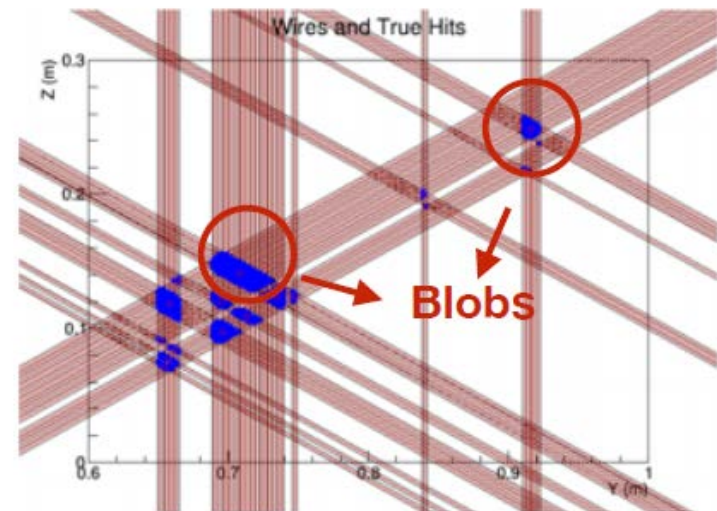
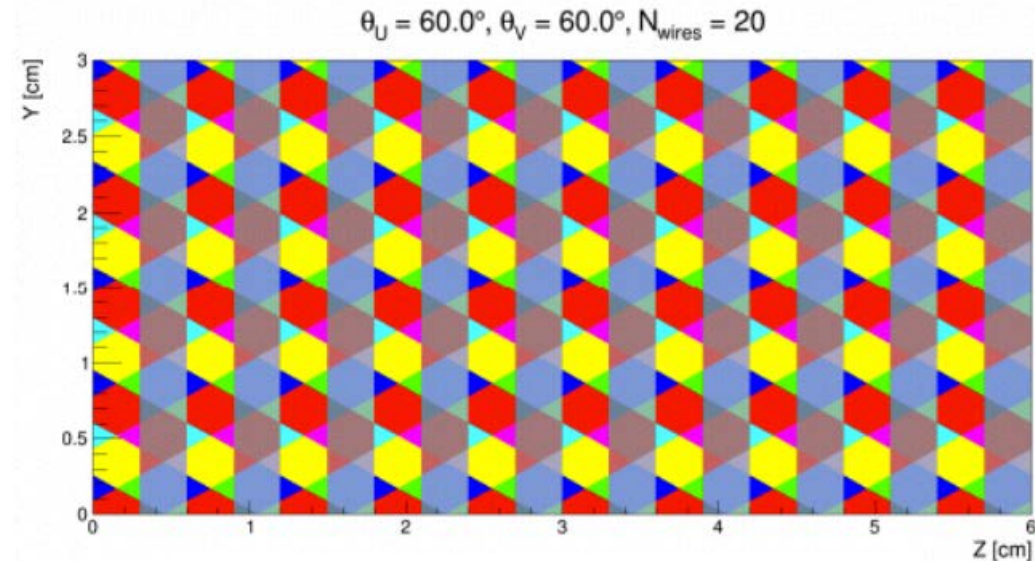


- ❑ In Wire-Cell reconstruction, we don't use the traditional concept of "Gaussian Hits".
  - Avoids the complications in fitting the waveform (especially for a long signal)
- ❑ Instead, we simply define a time slice as a 2-us bin
  - Binning choice matches the shaping time
- ❑ Charge in a time slice on a wire is the sum of its de-convoluted signals



# Wires, Cells and Blobs

- ❑ **Wire:** a Wire represents a  $\pm$  pitch/2 rectangular region centered around the wire
- ❑ **Cell:** a Cell is the overlap region of three Wires. This is the smallest area unit on a plane.
- ❑ **Blob:** group of hit cells that are adjacent
  - Merge cells into blob to reduce degeneracy



# $\chi^2$ Construction and Minimization

$$\chi^2 = (\mathbf{B} \cdot \mathbf{W} - \mathbf{G} \cdot \mathbf{C})^T \mathbf{V}_{BW}^{-1} (\mathbf{B} \cdot \mathbf{W} - \mathbf{G} \cdot \mathbf{C})$$

$$\frac{\partial \chi^2}{\partial \mathbf{C}} = 0 \rightarrow \mathbf{G}^T \mathbf{V}_{BW}^{-1} (\mathbf{B}\mathbf{W} - \mathbf{G}\mathbf{C}) + (\mathbf{B}\mathbf{W} - \mathbf{G}\mathbf{C})^T \mathbf{V}_{BW}^{-1} \mathbf{G} = 0$$

$$\mathbf{G}^T \mathbf{V}_{BW}^{-1} \mathbf{B}\mathbf{W} + \mathbf{W}^T \mathbf{B}^T \mathbf{V}_{BW}^{-1} \mathbf{G} = \mathbf{G}^T \mathbf{V}_{BW}^{-1} \mathbf{G}\mathbf{C} + \mathbf{C}^T \mathbf{G}^T \mathbf{V}_{BW}^{-1} \mathbf{G}$$

$$\mathbf{C} = (\mathbf{G}^T \mathbf{V}_{BW}^{-1} \mathbf{G})^{-1} \mathbf{G}^T \mathbf{V}_{BW}^{-1} \mathbf{B}\mathbf{W}$$

- ❑ **C**: charge in each (merged) cell (to be solved)
- ❑ **G**: Geometry matrix connecting cells and wires
- ❑ **W**: charge in each single wire
- ❑ **B**: Geometry matrix connecting merged wires and single wires
- ❑  $\mathbf{V}_{BW}$ : Covariance matrix describing uncertainty in wire charge

# When equations can not be solved

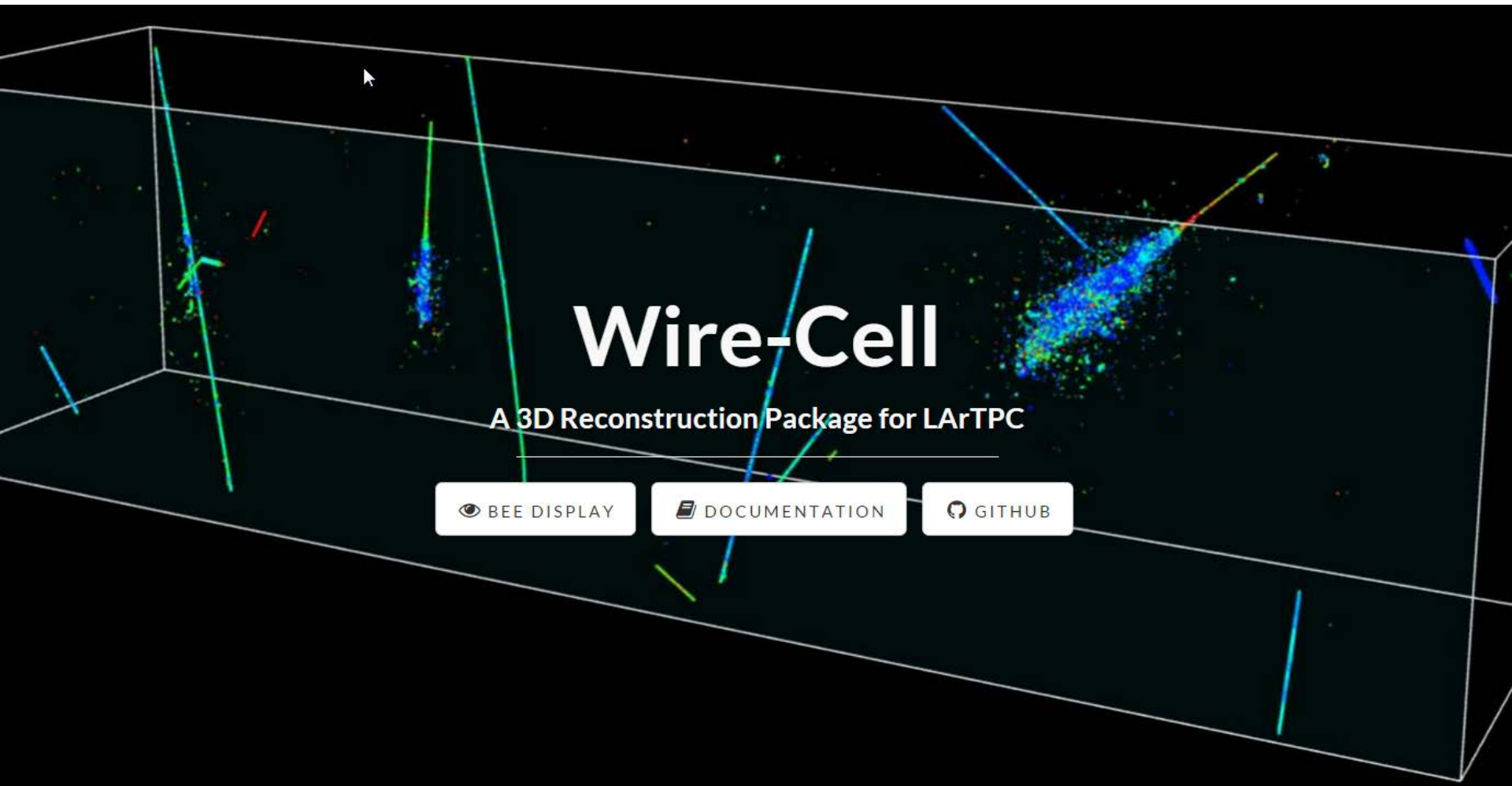
- ❑ When the matrix  $G^T V_{BW}^{-1} G$  can not be inverted, it must contain more than one zero eigenvalues
  - Often an indication of more unknowns than constraints
  - Need to find the “best” solution
- ❑ One hypothesis is to eliminate certain number of “Blobs” (i.e. unknowns) so that the updated matrix can be solved
  - Assume number of real cells are smaller than the constraints
  - Assume smaller  $\chi^2$  representing situation closer to the truth
  - Try all combinations and find the minimum  $\chi^2$ 
    - Degeneracy scales exponentially with number of possible cells
    - The key is to develop algorithms to improve the speed and accuracy: Iterative, MCMC, Time ...

# Comparison With Tradition Reconstruction

- ❑ Start with “time” Information
  - ❑ Do clustering and tracking in the three 2D time-wire planes
  - ❑ Match the three 2D views to obtain the 3D space points
  - ❑ Use 3D space points and the charge on wires to do physics
- ❑ Start with “charge” Information
  - ❑ Obtain 3D space points (with charge) by solving equations in the 2D tomographic plane
  - ❑ Do clustering and tracking in 3D directly
    - Use time/tracking information to iteratively improve equation solving
  - ❑ Do physics

# The Wire-Cell Homepage

<http://www.phy.bnl.gov/wire-cell/>



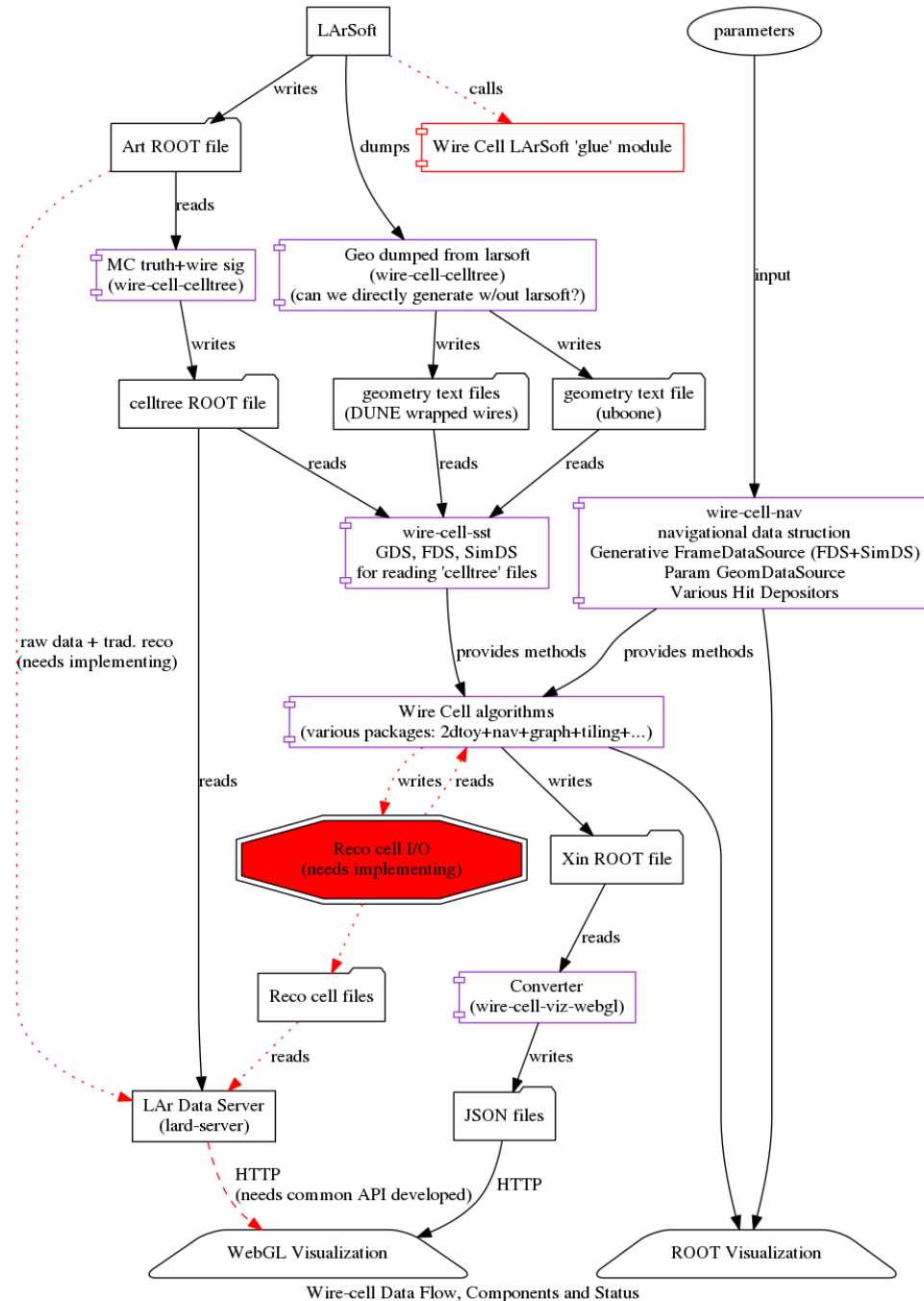
# Software

❑ This is an external software package outside of LArSoft

▪ <https://github.com/BNLIF/wire-cell/>

❑ Maintained by **Brett Viren**

❑ Interface with LArSoft in development



# The “Bee” Event Display

- ❑ We’ve made a web-based event display to help
  - **Developers**: compare the performance of different reconstruction algorithms
  - **Users**: eye san various events to gain intuitions of different interactions in LAr
- ❑ List of simulated event sets:
  - <http://www.phy.bnl.gov/wire-cell/examples/list/>
  - Currently, all are using the microboone single TPC geometry.
  - There are some 3 GeV events (numu-cc, numu-nc, nue-cc) that we made to get familiar with DUNE-type events

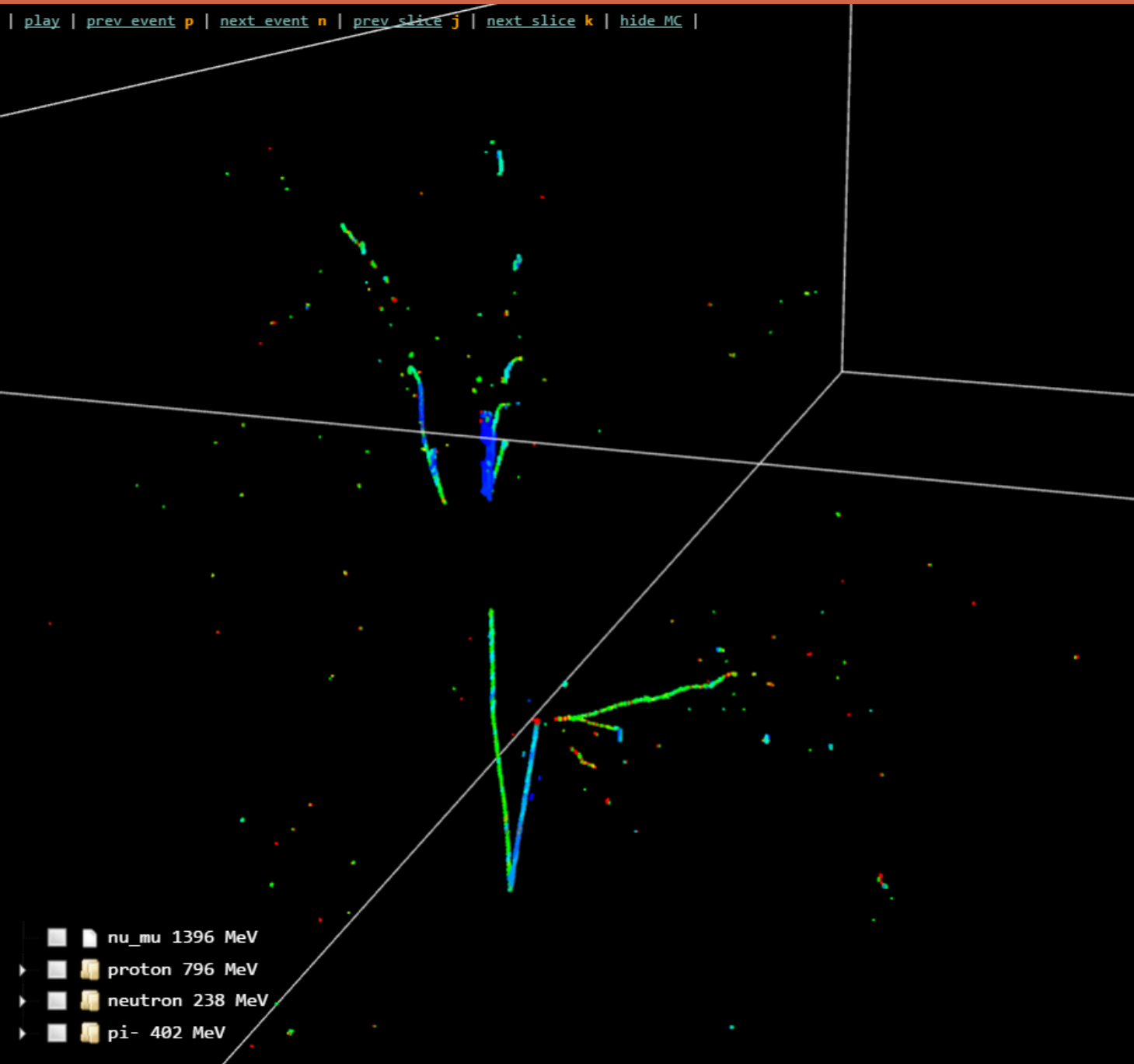
# The “Bee” Event Display

- ❑ Developed with **WebGL** via the **three.js** library <http://threejs.org>
  - Runs everywhere with a modern browser (Chrome, Firefox, Safari, IE11+, etc. <http://caniuse.com/#feat=webgl>)
  - A good discrete GPU helps

	Mouse / Keyboard	Touch
Rotate	Drag with left button	One finger touch
Zoom	Mouse wheels	Pinch & zoom / two finger scroll
Pan	Drag with right button / arrow keys	Three finger swipe



| play | prev\_event p | next\_event n | prev\_slice j | next\_slice k | hide\_MC |



Event

Display

Show Charge

Recon (Charge)

size

opacity

Truth

size

opacity

Recon (Simple)

size

opacity

Recon (De-blob)

size

opacity

Slice

sliced mode

opacity

width

position

Camera

Center to Event

Drift-Wire View

Reset

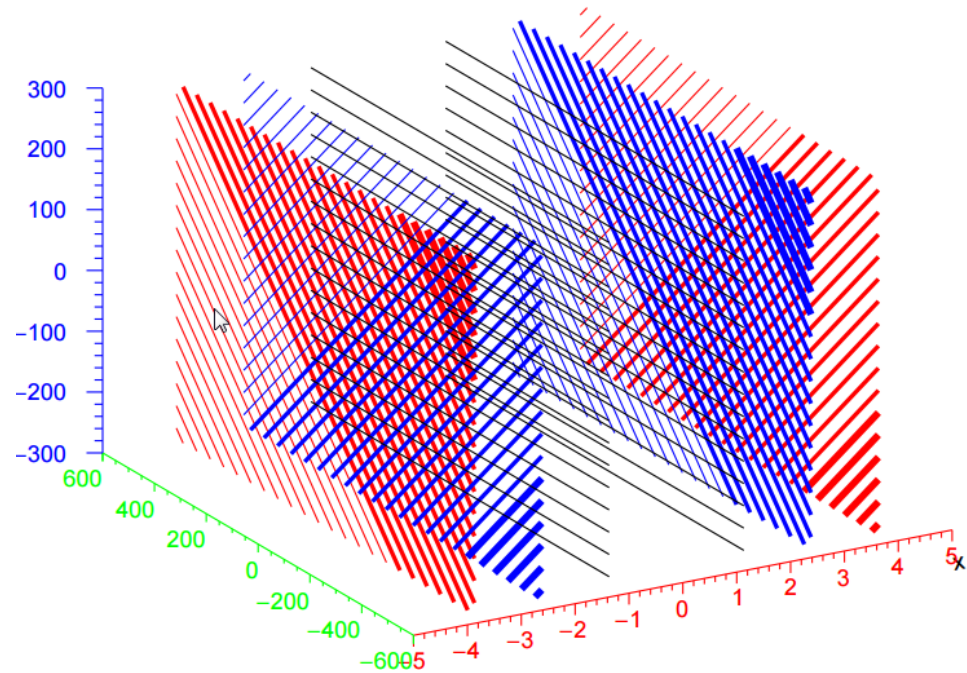
Ortho Camera

Close Controls

- nu\_mu 1396 MeV
- proton 796 MeV
- neutron 238 MeV
- pi- 402 MeV

# To-do List

- ❑ Add capability of wrapped wire, multiple TPCs, and parametrized TPC
- ❑ Study disambiguity
- ❑ Study TPC optimization
- ❑ Implementing interface with LArSoft
- ❑ Improve the clustering and tracking
- ❑ Improve the equation-solving algorithms
- ❑ ...



**Lots of work to do  
and need many  
helps!**