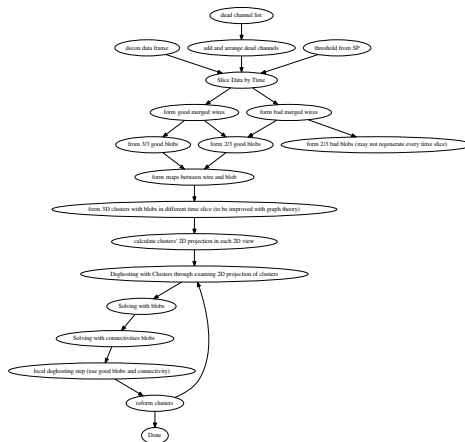


# Progress adding 3D imaging to the Wire-Cell Toolkit

# Process

- Follow Xin's **WCP imaging summary slides**
- Follow Xin's high level “imaging flow” →
- Stare at WCP code, but no copy-paste allowed! 😊
- Add some new ideas and optimizations.
- Development steps:
  - 1 implement basic operations as “util” code.
  - 2 Design WCT data and component interfaces.
  - 3 Iterate as realism is added (ie, test on full sim/data, dead wire support).



# Core, high level operations

- Slicing (done)
- Striping (done, but in the end, not needed)
- Tiling (done)
- Clustering (done)
- Solving (in progress)

“done”, here, means code works on idealized tests.

I'll next go through each one.

# Slicing

*Cut up a readout **frame** of signals into a queue of time **slices** with each slice holding a set of **active channels** and the sum of their waveform sample values in the time **span** of the slice.*

- A **slice** data object has:
  - ident** some identifying **number**
  - start** when in **time** the slice begins.
  - span** the **duration** of the time interval covered.
  - activity** a **map** from channel to a value (signal charge)
  - frame** a back-pointer to the original **frame**.
- Algorithm: the obvious thing.

# Striping

*Collect all **channels** in a **slice** with a **value** above a **threshold** along with their **connected wires** such that the wires are **contiguous** in their plane.*

- In DUNE a stripe may “wrap” around the APA, both in terms of the wire conductors and the list of channels.
  - In the end, this wasn’t needed for **tiling** (next).
  - However, it has a “cute” solution:
- ① Build a **graph** with each **channel** above threshold connected to its 1, 2 or 3 **wires** and in that set connect each wire to its **neighbor** in the plane.
  - ② Call `boost::connected_components()`, done!

The returned value is effectively the list of “stripes” for the slice.

# Tiling

*Tiling identifies **spatial regions in a slice** which are **likely consistent** with containing **ionization activity** based on knowing **wire geometry** and **channels above threshold**.*

- Although, more accurately we **remove** regions which are **definitely not consistent** with....
- Tiling is the core starting point for 3D imaging, and inherently very **combinatoric** so optimizations are very welcome.
- And a nice one has been found....

# Ray Grid Optimization

*Exploit **uniform wire angle and pitch** to make wire geometry calculations cheap.*

The concepts are actually rather simple but they need some detailed slides....

# Ray Grid

**Ray:** (as used here) is a **line segment** defined by **two 3D endpoints** and a **direction**.

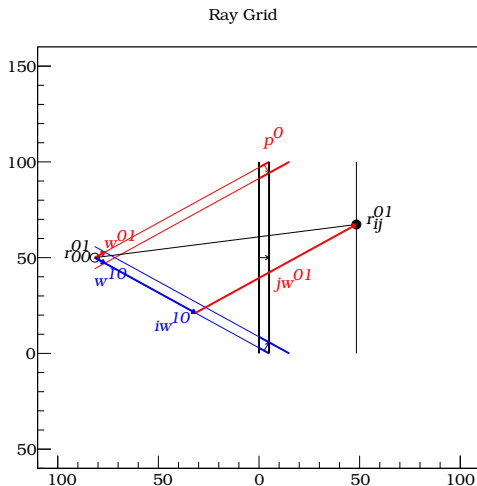
- Each real wire (segment) has an associated ray.
- Define two parallel rays, **ray0** and **ray1** offset by  $\pm \frac{1}{2}$  pitch on each side of **wire 0** for each wire plane.
- This ray pair may define a 2D coordinate system:
  - origin: center of **ray0** (projected to  $x = 0$ )
  - $\hat{z}$  axis along  $\overrightarrow{pitch}$
  - ↑  $\hat{y}$  axis along  $\overrightarrow{ray}$
  - ⊗  $\hat{x}$  by RHR (anti-drift direction)
- ↔ Also defines a **1-D linear grid** along plane pitch direction.
- ⇒ Specifying a **ray index** specifies a **pitch location**.
- ⇒ Valid **ray indices**  $\in [0...N_{wires}]$  (inclusive and for each plane)

Thus, each wire-plane **layer** has a **ray grid**.

I'll say why I change names to "layer" in a bit.



# 3-layer example of Ray Grid vectors



**ray0/ray1** pairs for **U,V,W** planes. Other vectors described next.

## Two Ray Grids

Combining two 1-D ray grids form a **regular 2D grid**, may provide a **non-orthogonal coordinate system**.

Each ray grid is one “layer”.

$p^l$  relative **pitch vector** for layer  $l$ .

$c^l$  the **origin point** (center of **ray0**) for layer  $l$ .

$r_{ij}^{lm}$  a **crossing point** of ray  $i$  from layer  $l$  and ray  $j$  from layer  $m$ .

$w^{lm}$  relative **displacement vector** for layer  $l$  connecting crossing points of neighboring layer- $m$  rays on a ray of layer  $l$ .

(revisit diagram on previous slide)

# The Key Optimization

Given vectors  $p^l$ ,  $c^l$  and tensor  $w^{lm}$  for **two layers** and one explicitly calculated crossing point  $r_{00}^{lm}$  the tensor of **all other crossing points**  $r_{ij}^{lm}$  is trivial:

$$r_{ij}^{lm} = r_{00}^{lm} + jw^{lm} + iw^{ml}$$

- $r_{00}^{lm}$  and  $w^{lm}$  can be calculated with simple vector arithmetic
- **For  $N$  layers:** must calculate for **every pair of layers**.
  - This is  $\mathcal{O}(\frac{1}{2}N^2)$  but  $N = 5$  so we don't care.
    - ? (why 5 and not 3? it's coming!)

## 2-Layer crossing points in a 3<sup>rd</sup> layer

Core tiling operation: given a **crossing point**  $r_{ij}^{lm}$  what is its **pitch location** in a 3<sup>rd</sup>, layer  $n \notin \{l, m\}$ .

The tensor  $P$  of all such pitch locations:

$$P_{ij}^{lmn} = (r_{ij}^{lm} - c^n) \cdot \hat{p}^n$$

Where  $\hat{p}^n$  is unit vector in pitch direction of layer  $n$ .  
Expanding  $r_{ij}^{lm}$  from last slide,

$$P_{ij}^{lmn} = r_{00}^{lm} \cdot \hat{p}^n + jw^{lm} \cdot \hat{p}^n + iw^{ml} \cdot \hat{p}^n - c^n \cdot \hat{p}^n$$

Or more simply,

$$P_{ij}^{lmn} = ja^{lmn} + ia^{mln} + b^{lmn}, \quad (l \neq m \neq n)$$

The tensors  $a$  and  $b$  are scalar valued,  $a$  is not symmetric under a transpose of  $l$  and  $m$  and  $b$  is. Both have undefined diagonals

# Crossing point containment

Okay, the operation that is **really** needed is:<sup>1</sup>

*What rays in layer  $n$  bound a given crossing point  $r_{ij}^{lm}$  of layers  $l$  and  $m$ ?*

We simply normalize  $P_{ij}^{lmn}$  by the pitch and truncate to get the **index of the ray** which is **at or just below** (in pitch) the **crossing point**:

$$I_{ij}^{lmn} \equiv \text{floor}(P_{ij}^{lmn} / p^n)$$
$$(l \neq m \neq n)$$

---

<sup>1</sup>In WCP language: “is a *blob corner* in a *merged wire*?”

# Ray Grid Optimization Summary

We can now **very quickly** find:

- any crossing point of two rays (in different ray grids),
- the pitch location in a 3<sup>rd</sup> layer of this crossing point,
- the index of the nearby ray and thus
- the corresponding wire and the corresponding channel.

These are the building blocks. Now, on to tiling....

## Tiling prelude: Activity and why 5 layers

**Activity array:** a 1-D array, defined on a **ray grid**, with elements indicating possible “activity” somewhere near the ray<sup>2</sup>.

- Gives  $\mathcal{O}(1)$  lookup of a wire/channel given a pitch.
- For each plane, U, V and W the **activity array** is simply the channel **charge values** in the time slice **ordered/limited** by the **wires in the plane**.
- Add to these, **two special layers**, each of a single “wire” and “channel” which are **always active** and with a “pitch” equal to the height or width, respectively, of the sensitive area of the anode.

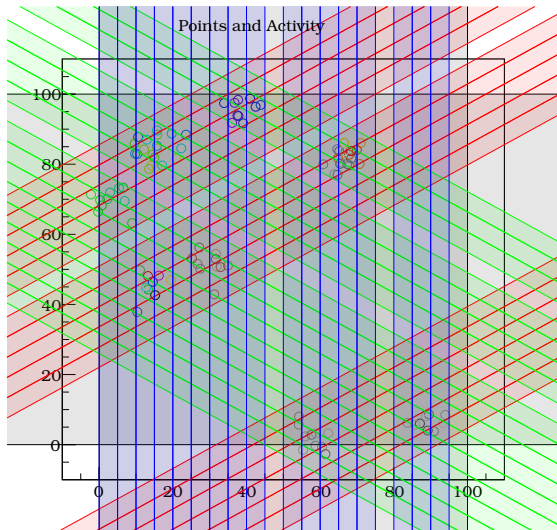
Tiling thus solves a  $2 + N$  layer problem where  $N = 3$  for pD/DUNE/MB but can be naturally extended to  $N = 4+$ .

---

<sup>2</sup>Each element is a “fired wire” in WCP language

# Activity arrays illustrated with toy simulation

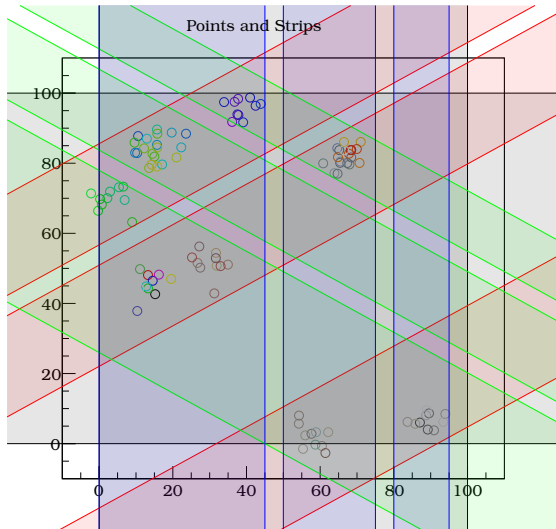
- Make random clusters of “electrons” in one slice.
- For each, find nearest wire from each plane and assign it +1 hit.
- Channels sum all hits on attached wires.
- Non-zero activity array elements colored by their plane. (threshold:  $n_{hit} > 0$ )
- The 2 special horiz/vert boundary layers are in gray.





# Activity array to Strips

- Scan each activity array to find contiguous regions above threshold.
- Collect set  $\{s_{ii'}^l\}$  of strips in layer  $l$  bound by ray  $i$  and ray  $i'$ .



# Strips to Blobs

*Blob: a contiguous region of mutual intersections of strips from all layers.*

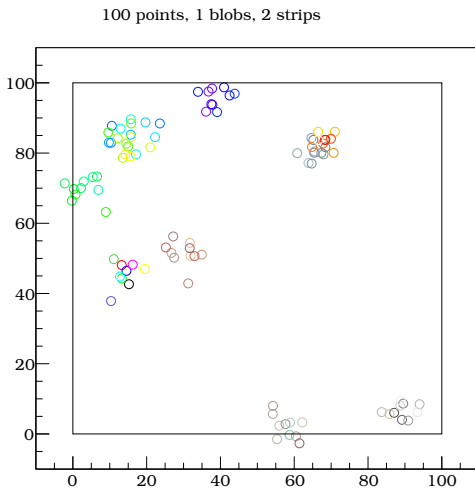
Procedure (ignoring some optimizations):

- ① Given layers 0, 1: find set of all crossing points  $\{r_{ij}^{01}\}$  of the **strip boundary rays** from  $\{S_{i'l}^l\}$ ,  $l \in 0, 1$ .
  - ② Add layer 2: find set  $\{r_{ij}^{l2}, r_{ij}^{2l}\}$  for  $l \in 0, 1$
  - ③ Discard any crossing point  $\{r_{ij}^{lm}\}$  which is not in a strip of any other layer  $n \notin \{l, m\}$ .
  - ④ goto 2 for layers 3, 4, 5, ....
- This is the **inherently combinatoric** process.
    - good thing ray grid optimization is so fast!

Next, I walk through an example applying each layer to the toy simulation....

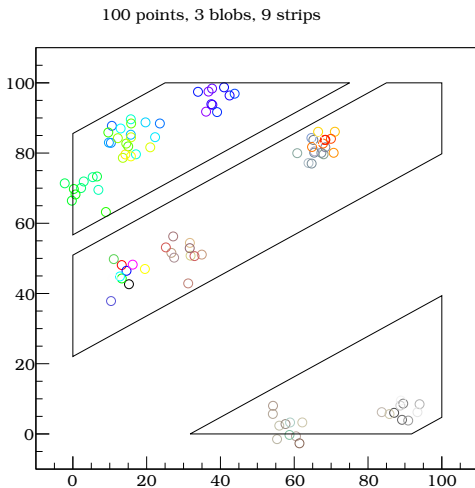
# Layers 0, 1

- L0+L1 is trivial.
- A single blob results which spans the overlap of the single horizontal and vertical strips and thus exactly spans the active area of the anode.
- The example detector is  $100 \times 100$  distance units in size.



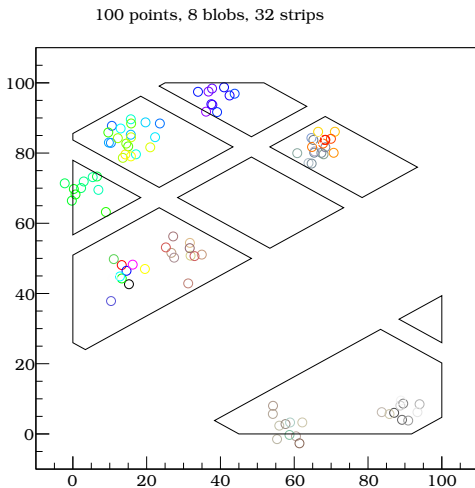
# Layers 0, 1, 2

- L0+L1+L2 adds first actual wire plane
- The previous single blob is broken into three.
- Each blob is defined by a pair of boundary rays from each layer.



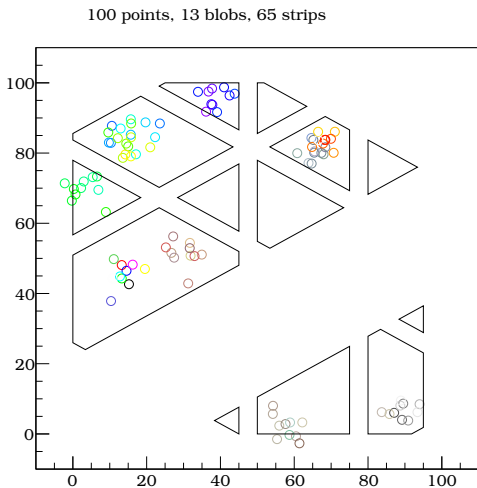
# Layers 0, 1, 2, 3

- L0+L1+L2+L3 adds second wire plane
- Three blobs become eight.
- Knowing the “true electrons” we start to see ghosts.

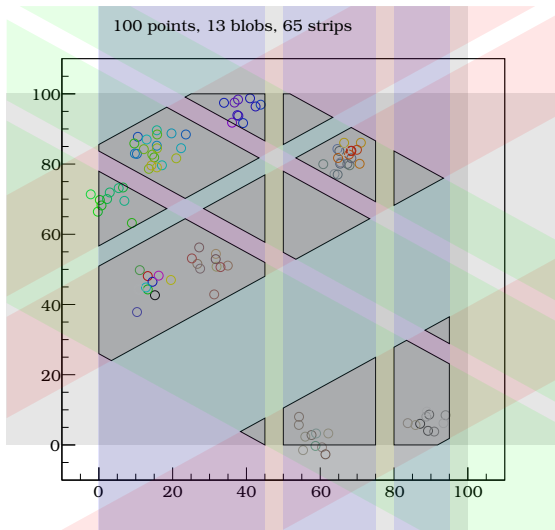


# Layers 0, 1, 2, 3, 4

- L0+L1+L2+L3+L4 adds final wire plane
- Eight blobs become 13.
- Some ghosts reduced in size and increased in number.
- Some ghosts may be removed, but not in this example.



# Final result + original strips



# Clustering

*Clustering (here) is the **association** of blobs between neighboring time slices based on their relative positions.*

- Essentially an extension of tiling except compare blob corners (still ray grid crossing points) in one slice against strip bounds of blobs in another slice.
- Can be used for applying **connectivity conditions** to remove some ghosts, in “solving” or to build extended 3D clusters.
- Currently, the definition of “overlap” of blobs is hard-wired. This can be improved to allow some parameterized “overlap distance” to be used.



# Clustering visitor

Clustering is a generic function which takes two lists of blobs and a **functor**:

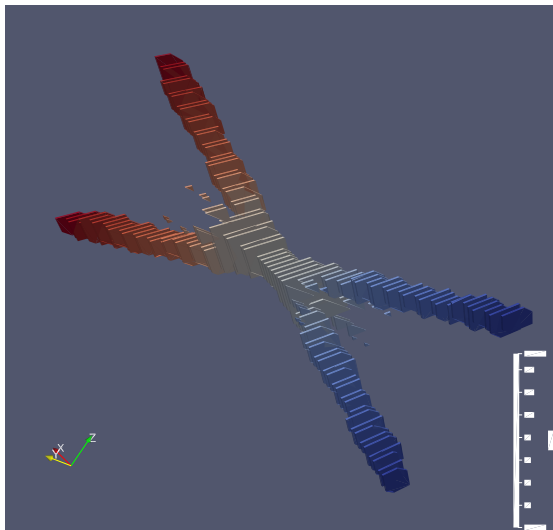
```
auto assoc = some_function_object;  
RayGrid::associate(blobs_1, blobs_2, assoc);
```

The `associate()` function will call the `assoc` functor for every pair of blobs which are associated.

It's then up to the user to do something fun in their functor.

# Visualization

- Support writing VTK files for ParaView and MayaVi.
- A little “hacky” but good for debugging.
- Shows blobs resolved from two line sources crossing at a point.
- Each “plate” is one blob.
- Color represents slice number.



# Solving

*Use measured charge information and wire geometry to invert  $M = G \cdot S$ .*

$S$  is charge in each blob,  $G$  is blob-channel connection,  $M$  is measured charge in channels.

- This work is just starting.
- It brings together blobs built from both APA faces because **now** wrapping adds complication.
- Maybe use connected subgraph trick (see “striping”) to partition  $G$  into smaller problems?
- Maybe look for an alternative to `ress`? Or, is it already the best available?

# Yet More To Do

- Complete the solving stage.
- Configure full chain test starting with trivial line sources.
- One more pass through my thinking to see how/where to handle dead channels.
- Test on real sim and real data.
- Help others to use, improve and validate.

A lot of more work, but progress is getting made!