



# GPU Pixel Tracks at HLT doublets filtering

## *Clustering & Machine Learning*

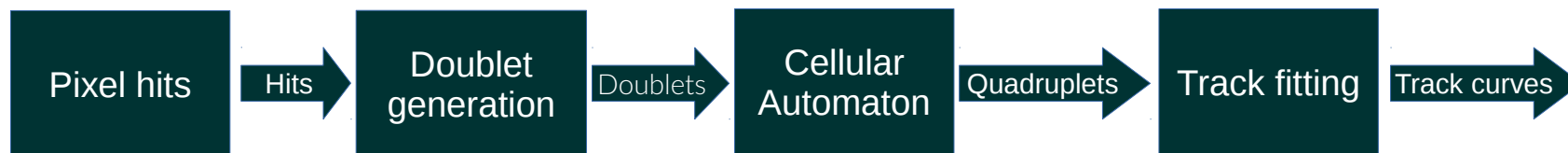
Adriano Di Florio

*INFN Sezione di Bari & Università degli Studi di Bari*

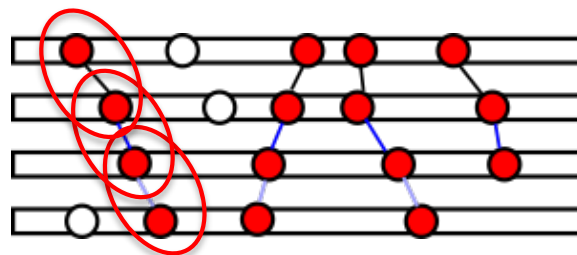
- *Current* Future Tracking Workflow plan



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Doublets construction  
based mainly on  
geometry



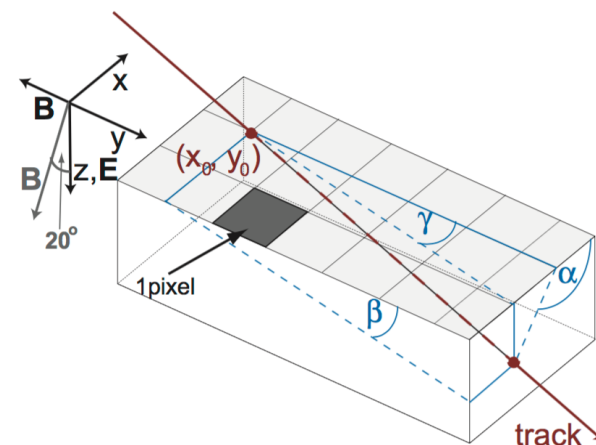
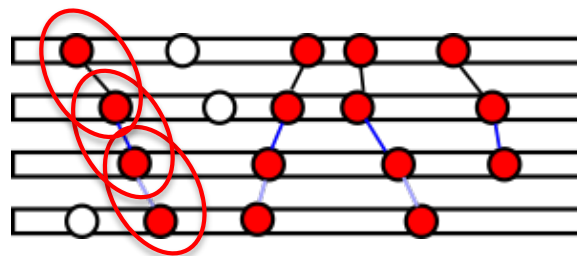
- *Current* Future Tracking Workflow plan



Doublets construction based mainly on geometry

**BUT** we can get some further information from the RECO Hits

**Hit Pixel Clusters**



$x$  is azimuthal direction in the barrel detector and radial direction in the forward detectors

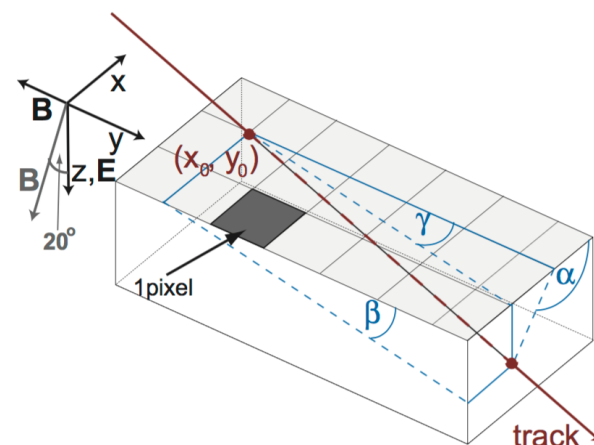
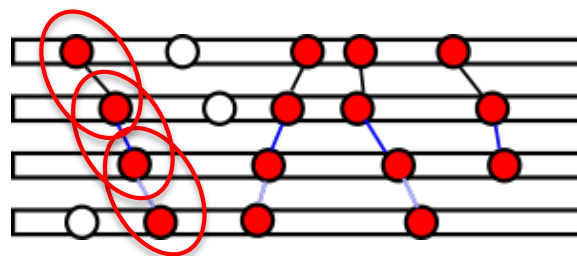
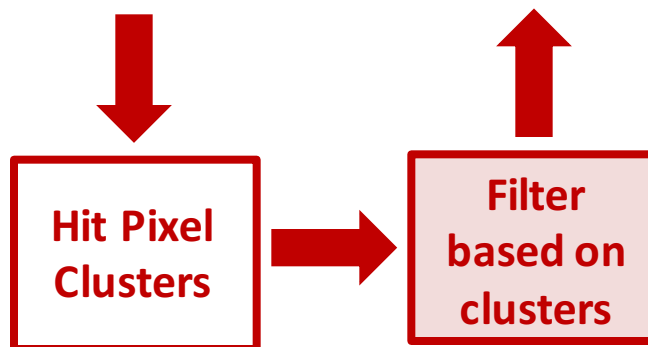
*How is a Pixel Cluster represented in CMSSW?*

- *Current* Future Tracking Workflow plan



Doublets construction based mainly on geometry

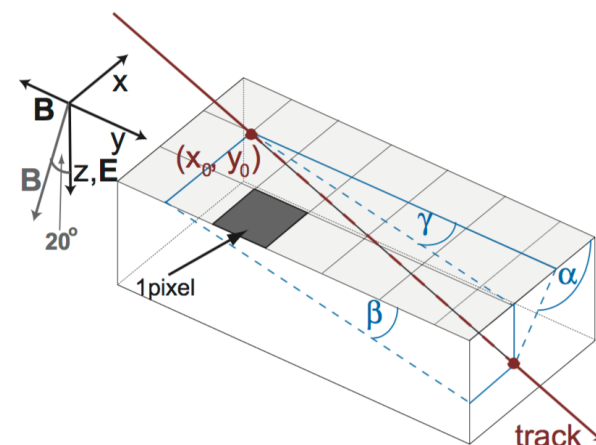
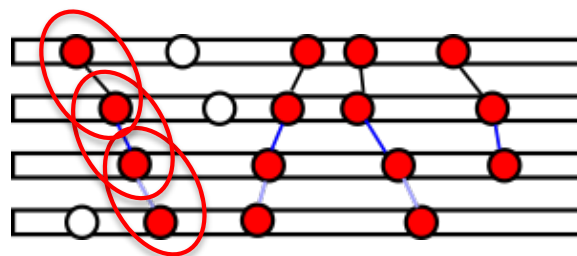
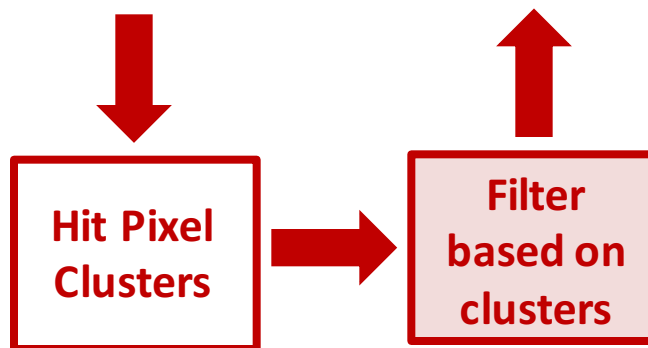
**BUT** we can get some further information from the RECO Hits



$x$  is azimuthal direction in the barrel detector and radial direction in the forward detectors

- 
- ```
graph LR; A[Pixel hits] -- Hits --> B[Doublet generation]; B -- Doublets --> C[Cellular Automaton]; C -- Quadruplets --> D[Track fitting]; D -- Track curves --> E[ ];
```

**BUT** we can get some further information from the RECO Hits



x is azimuthal direction in the *barrel detector*  
and radial direction in the *forward detectors*

## 1 Future Tracking Meeting



```
class SiPixelCluster
    "collection" of Pixel
    • uint16_t x
    • uint16_t y
    • uint16_t adc
```

**class** SiPixelCluster     $\longrightarrow$     Two vectors of `uint16_t` with *position* and *adc* values **only** for pixels turned on

“collection” of Pixel

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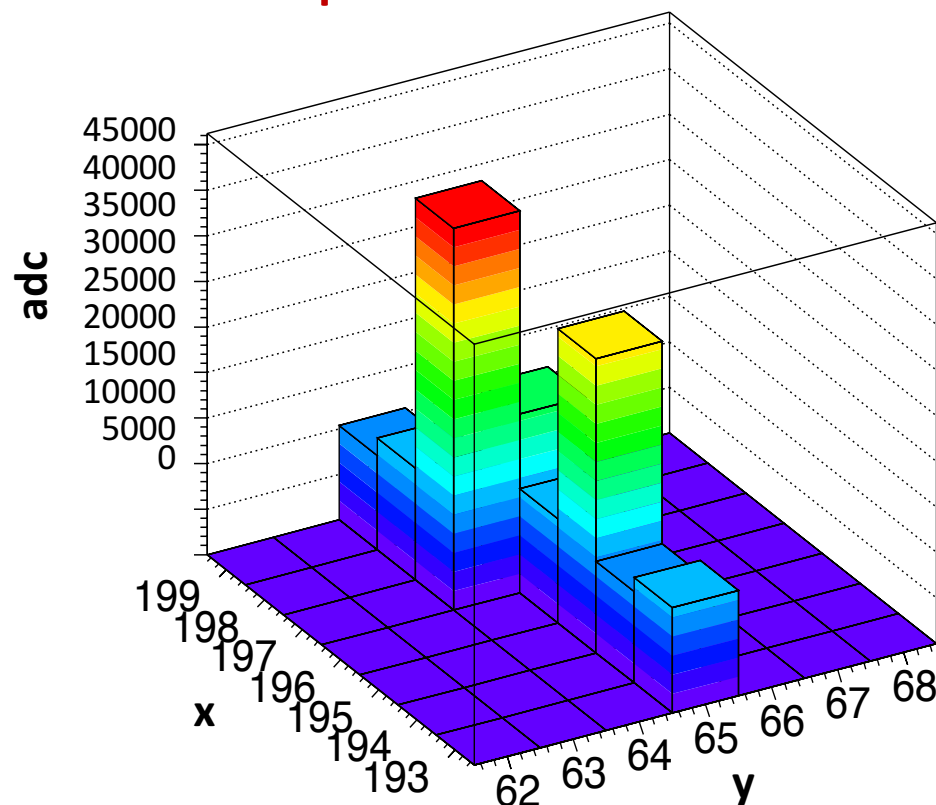


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7x7 pad



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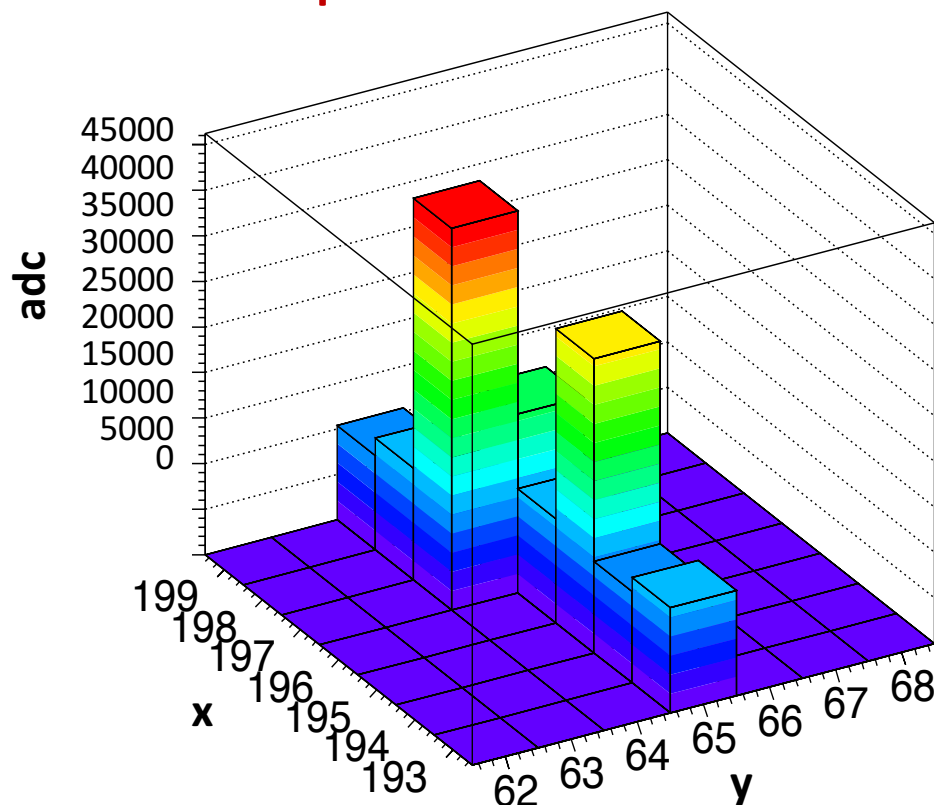
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## THE IDEA

*Use Machine Learning & Image Recognition techniques to add an additional filtering for doublets based on clusters shapes.*

**7x7 pad**



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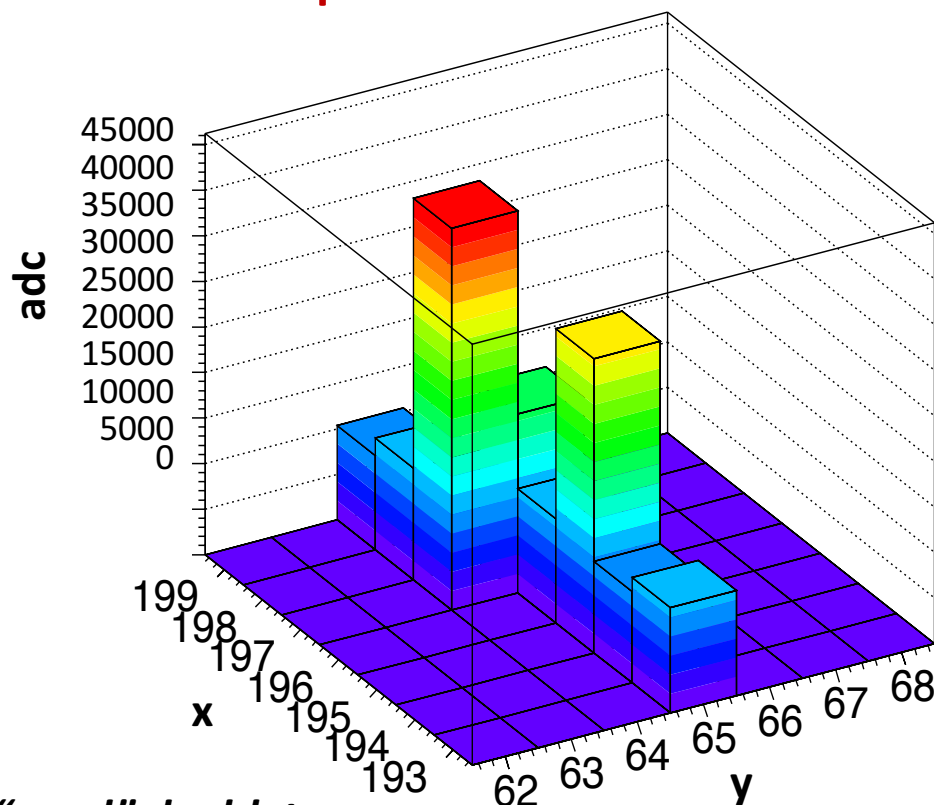
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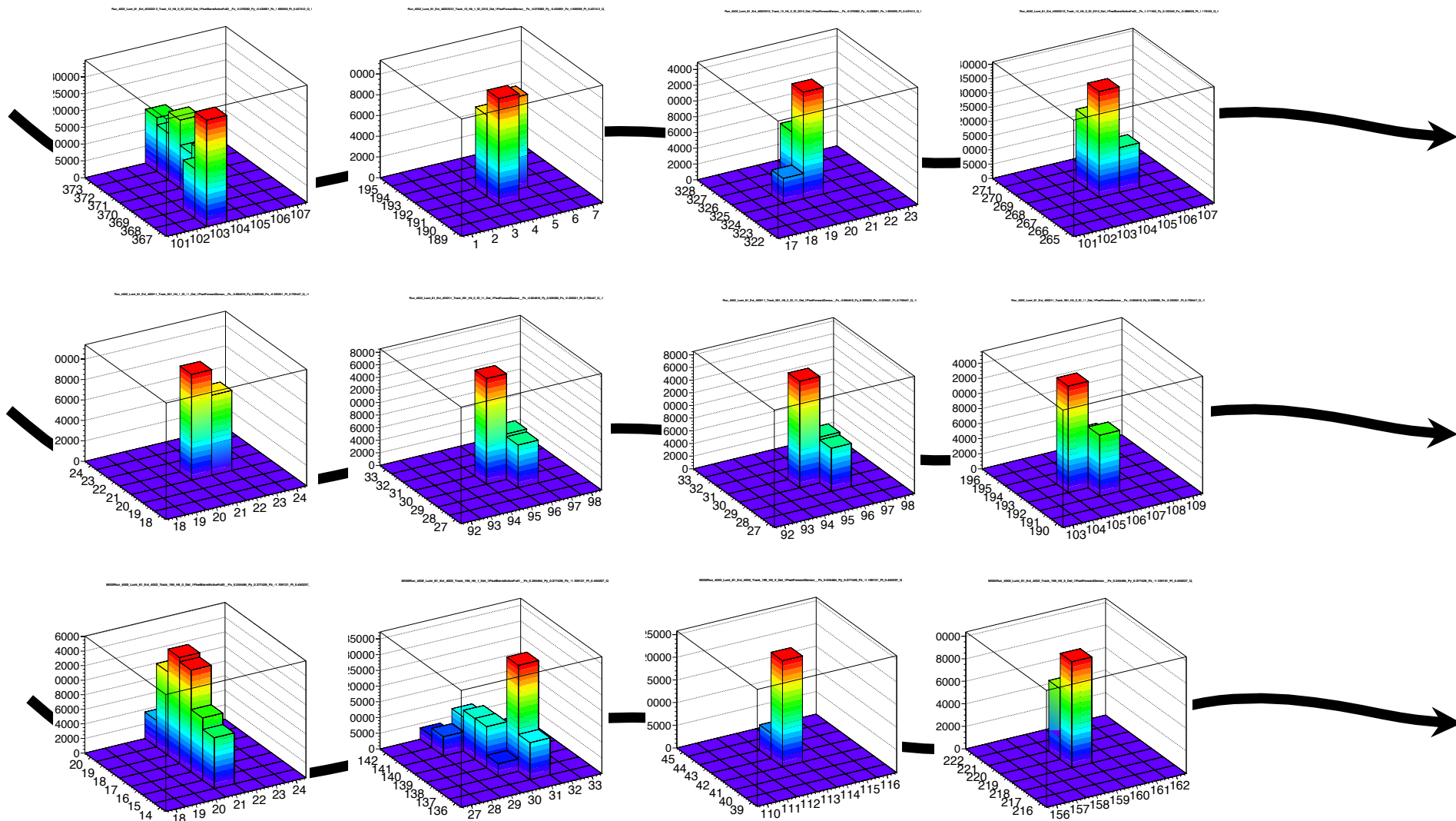
One of the first steps : *link clusters and “good” doublets.*

# Matching Tracks



## Example – RECO Tracks

TTbar\_13+TTbar\_13TeV (via runTheMatrix.py)



# Matching Tracks

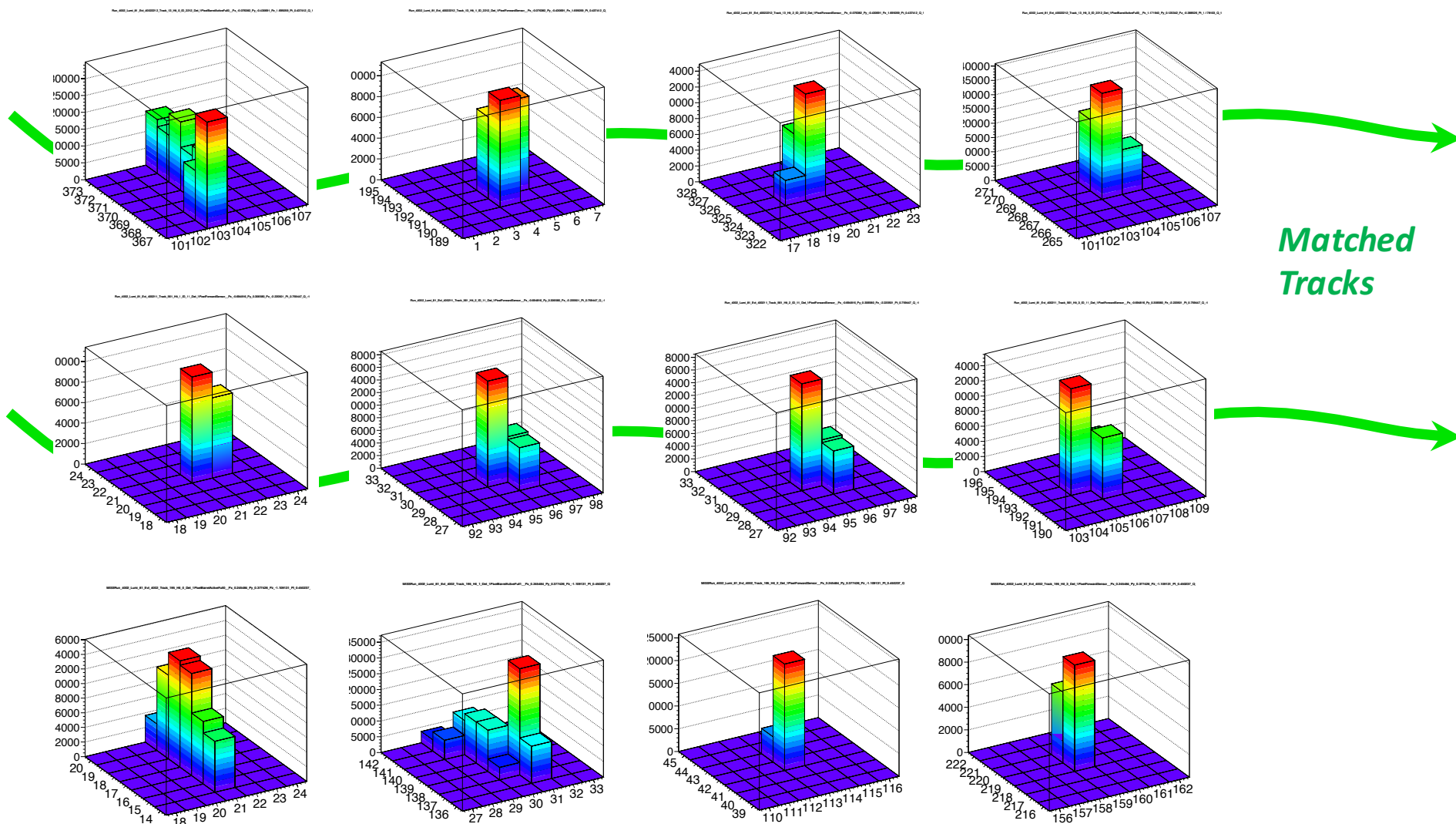


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## RECO – SIM matching

(MultiTrackValidator.cc)



# Matching Tracks

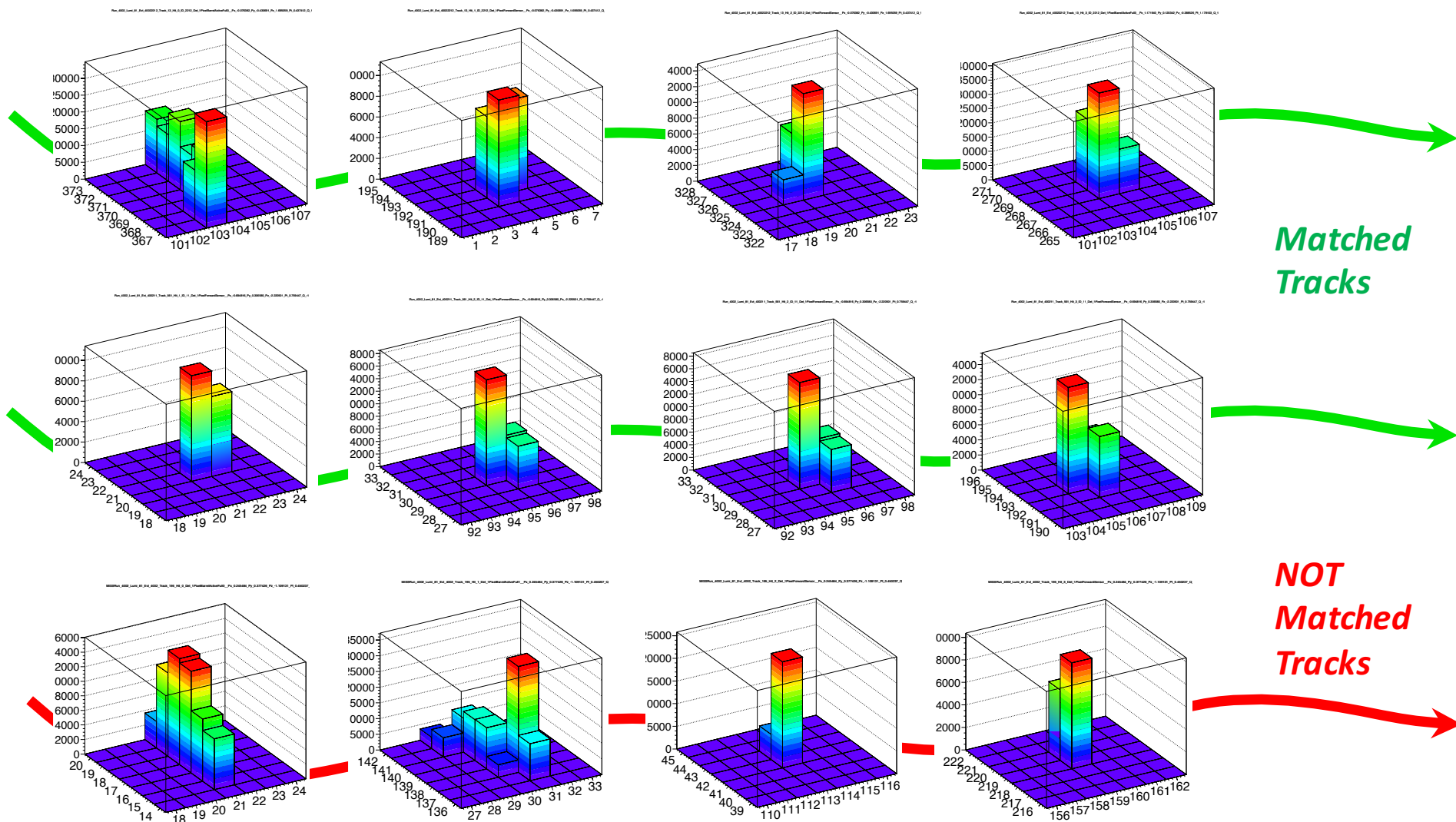


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**Matched Tracks**

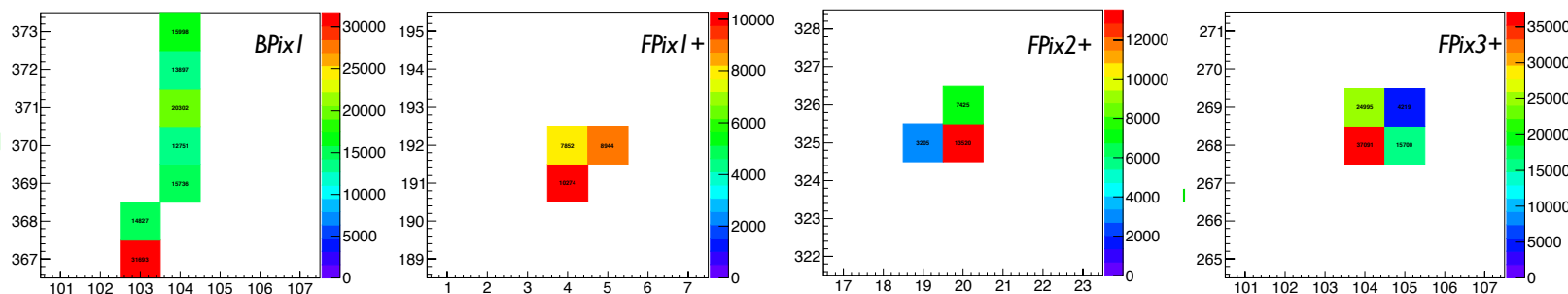
**NOT Matched Tracks**



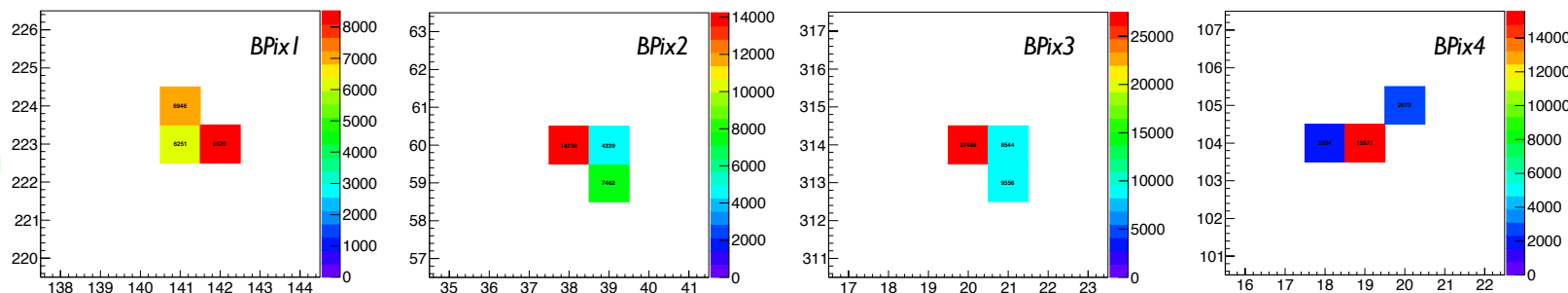
# Matching Tracks



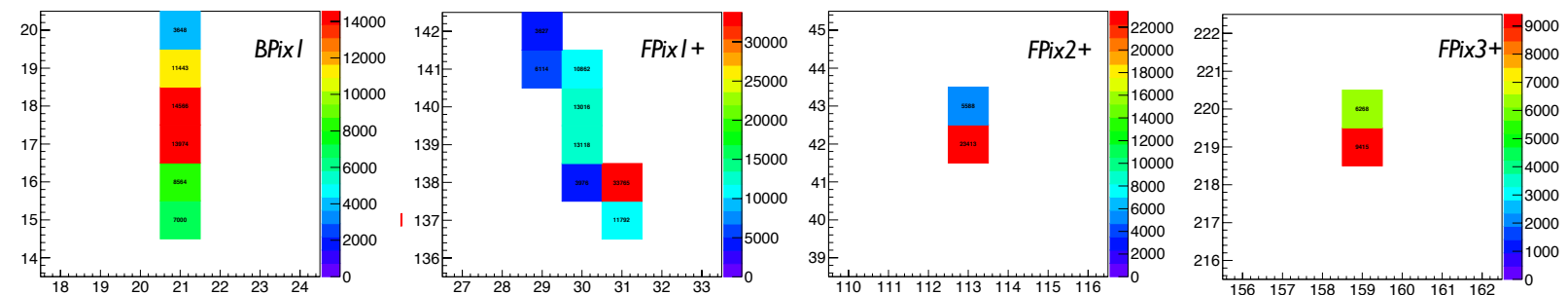
proton (id: 2212)



electron (id: 11)



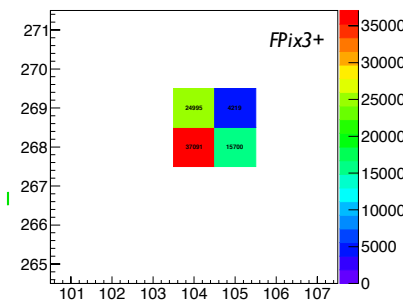
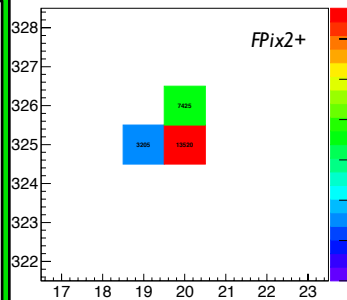
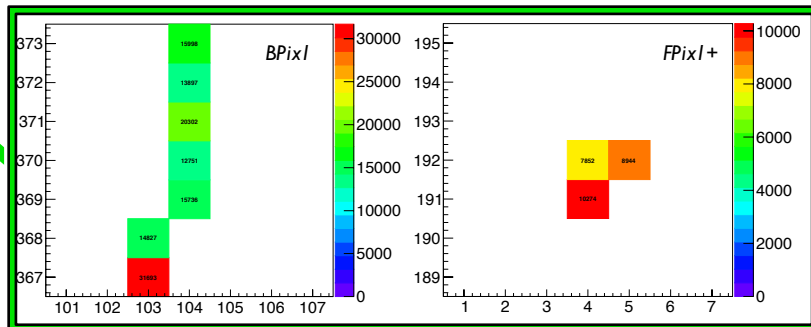
fake track



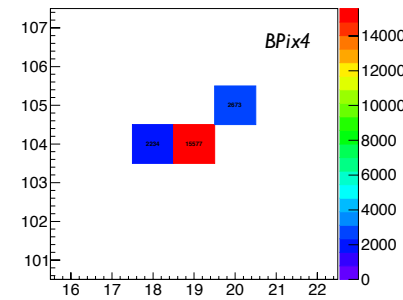
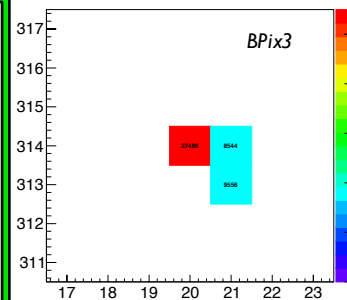
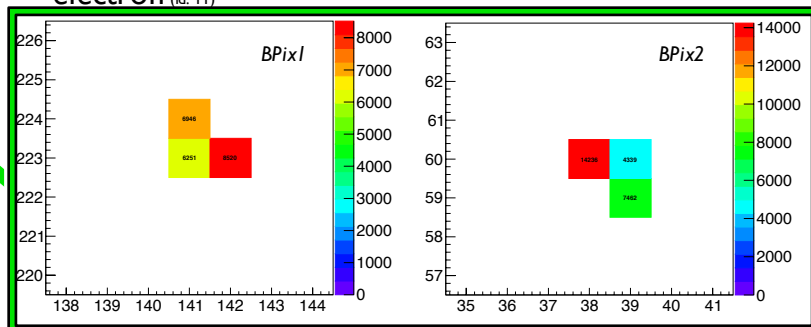
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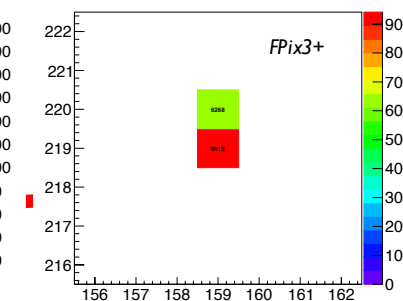
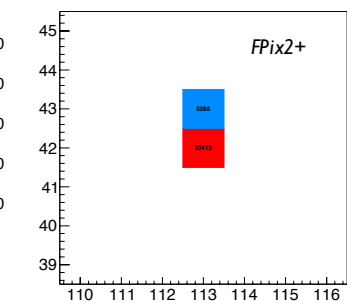
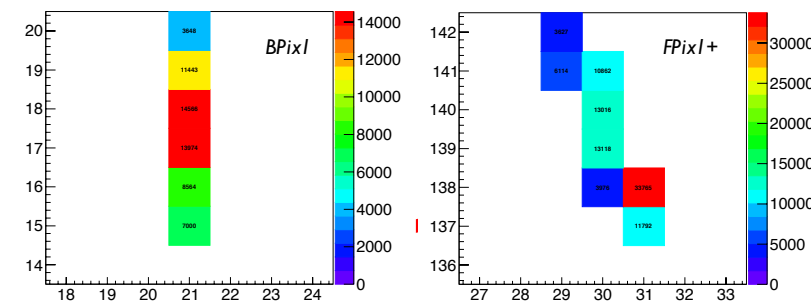
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fake track

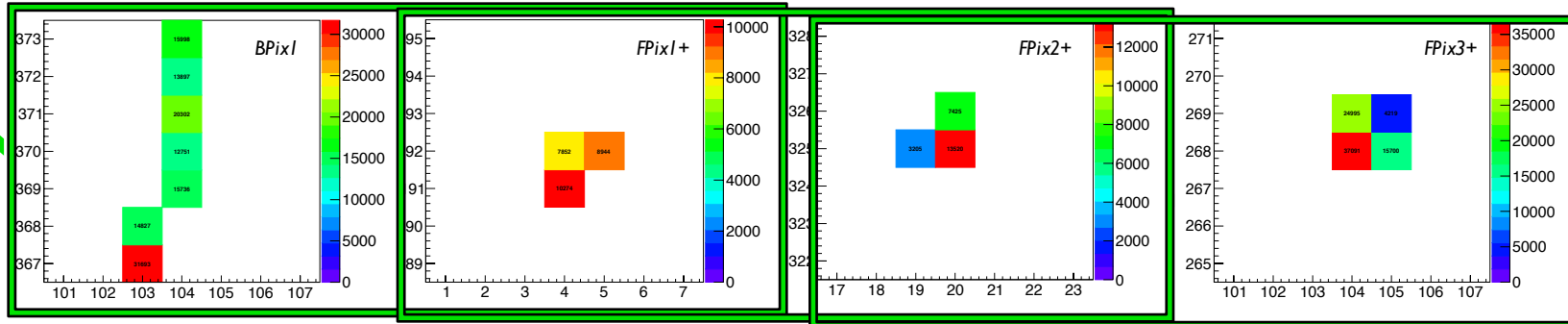




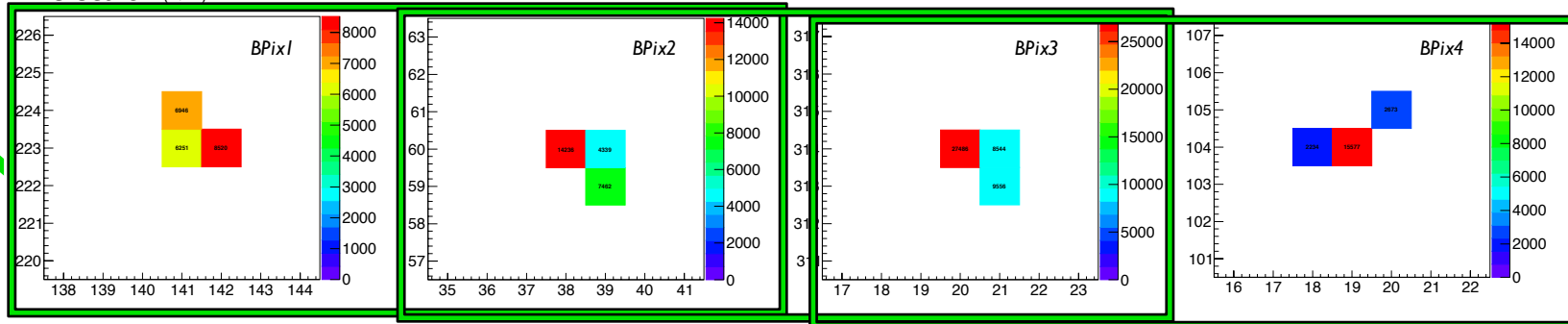
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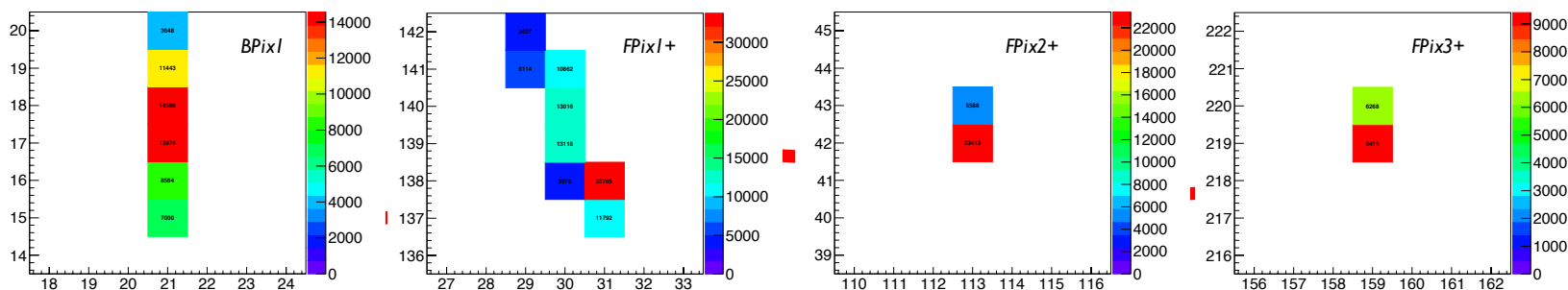
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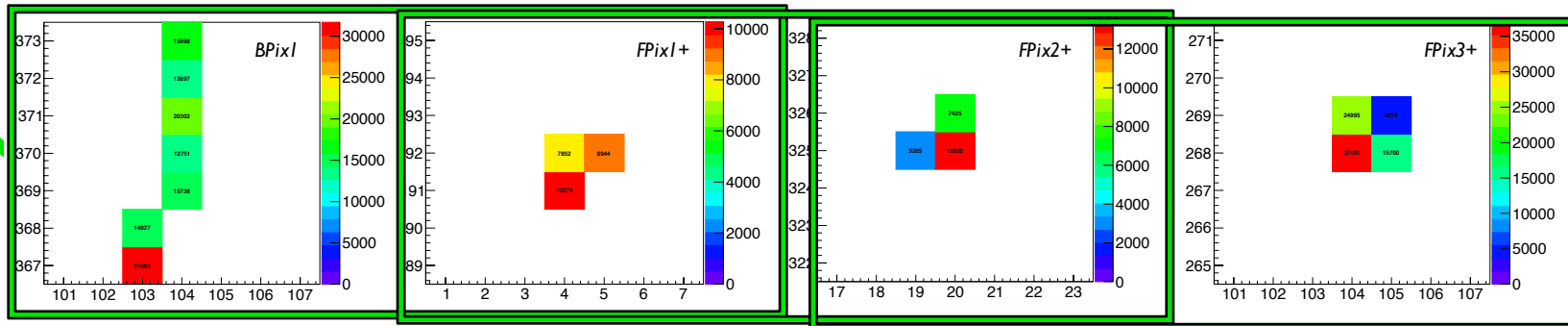
fake track



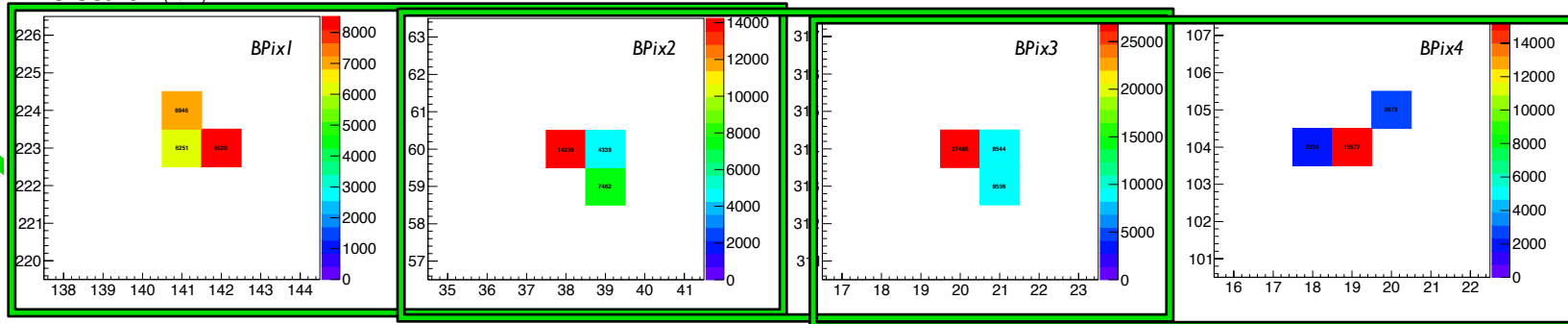
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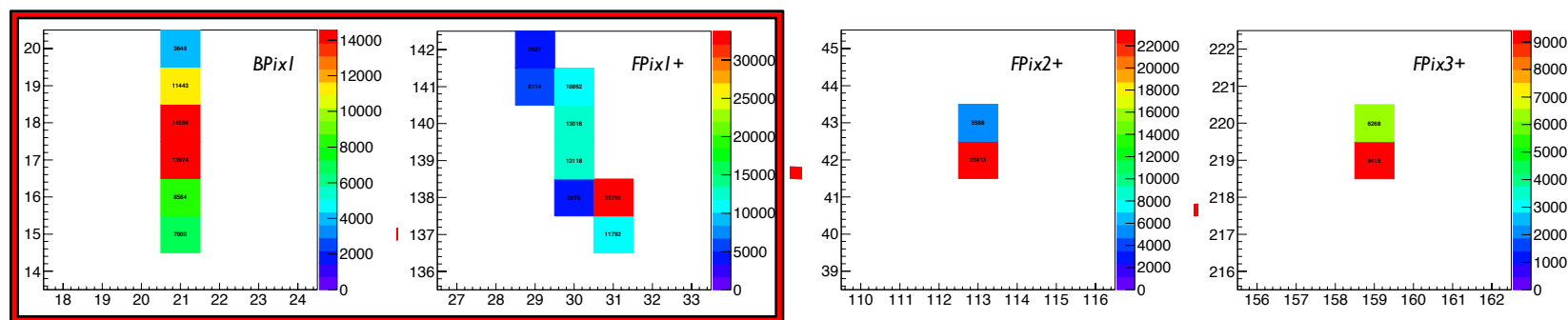
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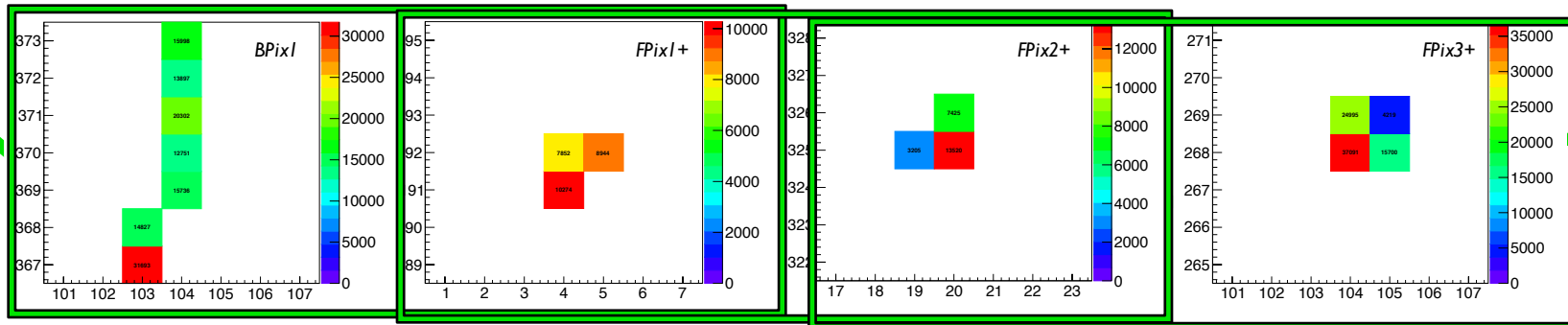
fake track



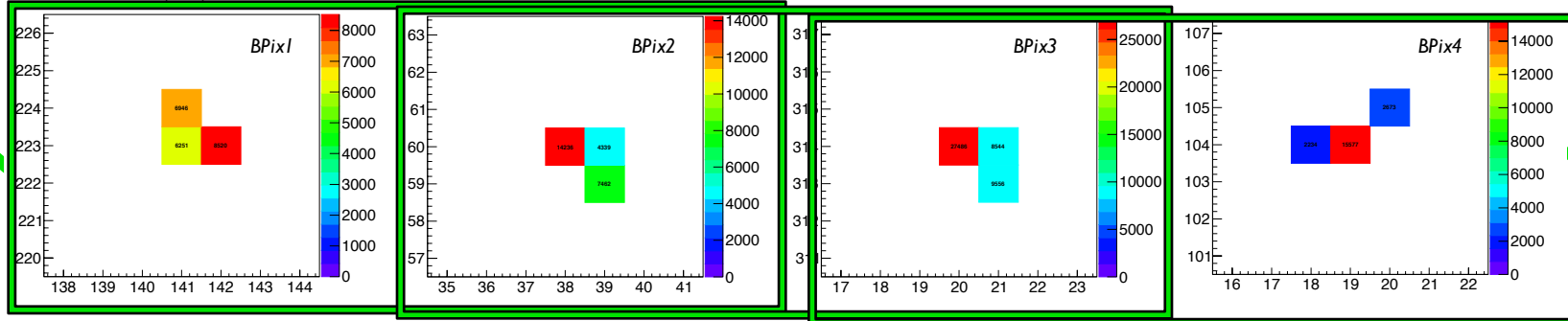
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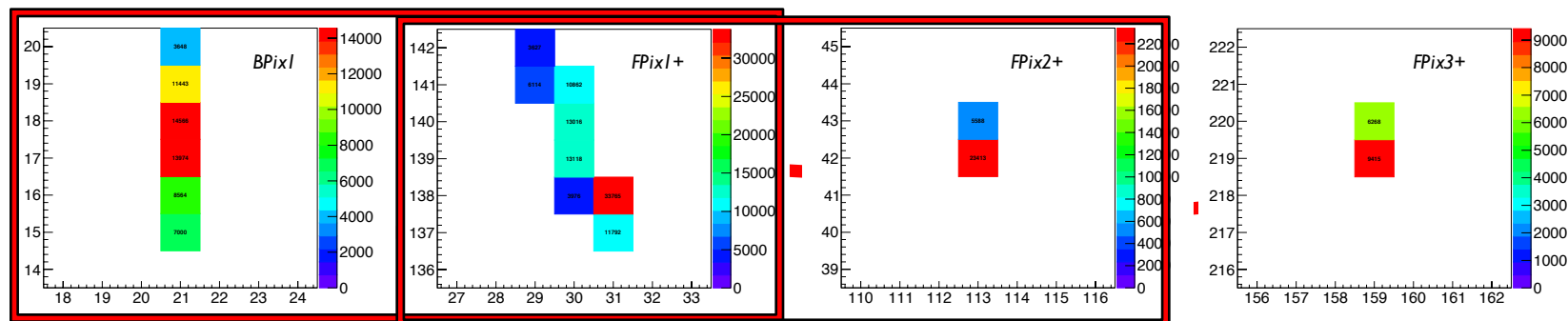
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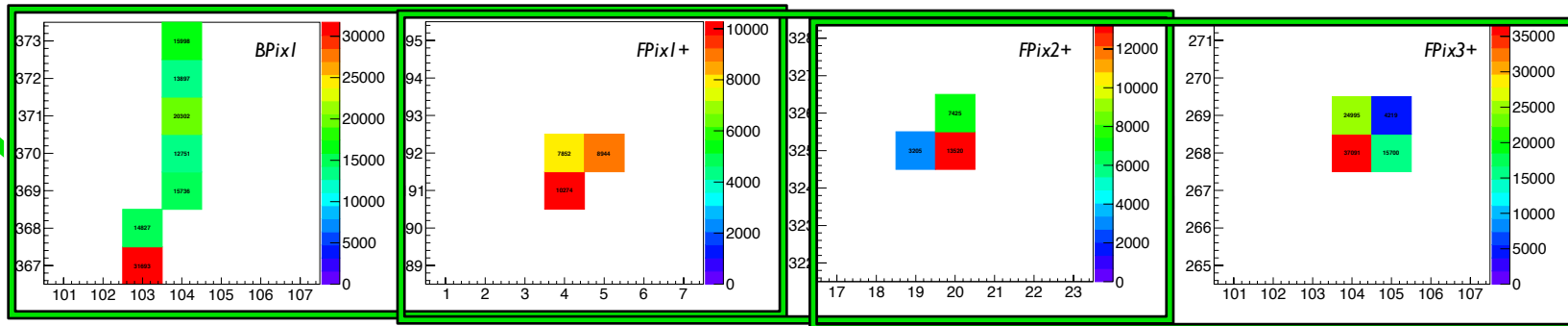
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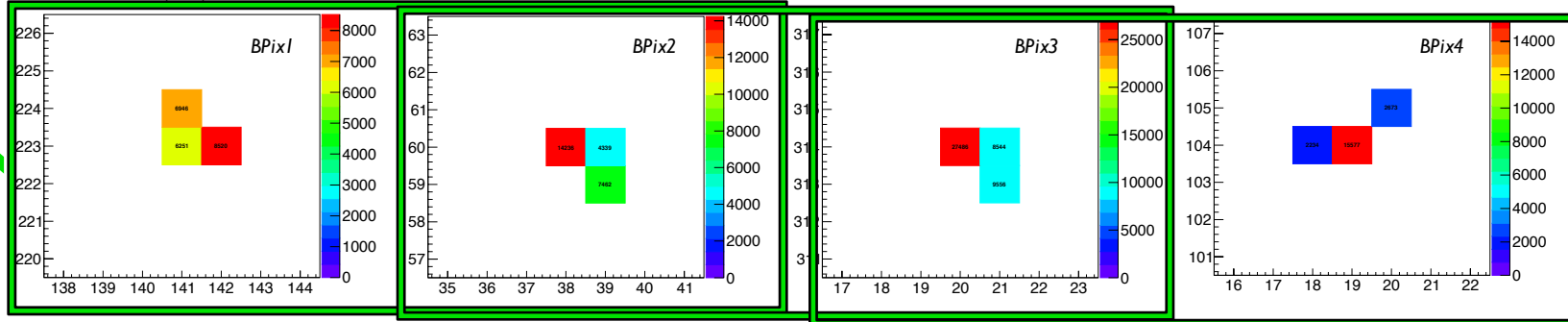
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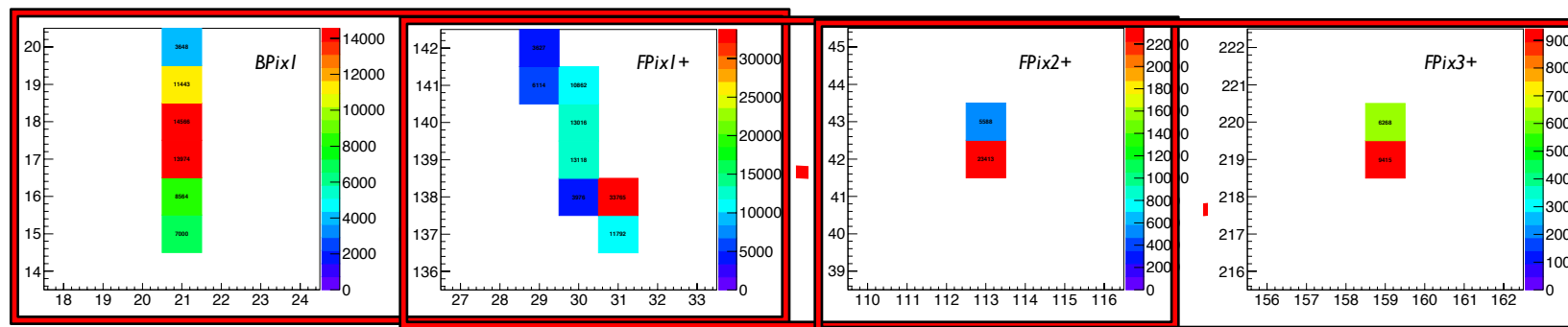
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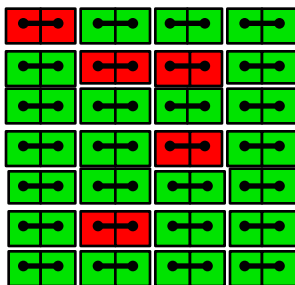


# The basic idea & next plans



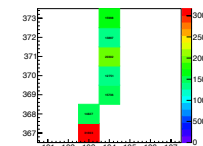
## TRAINING SET

- good way?
- data format?
- ...



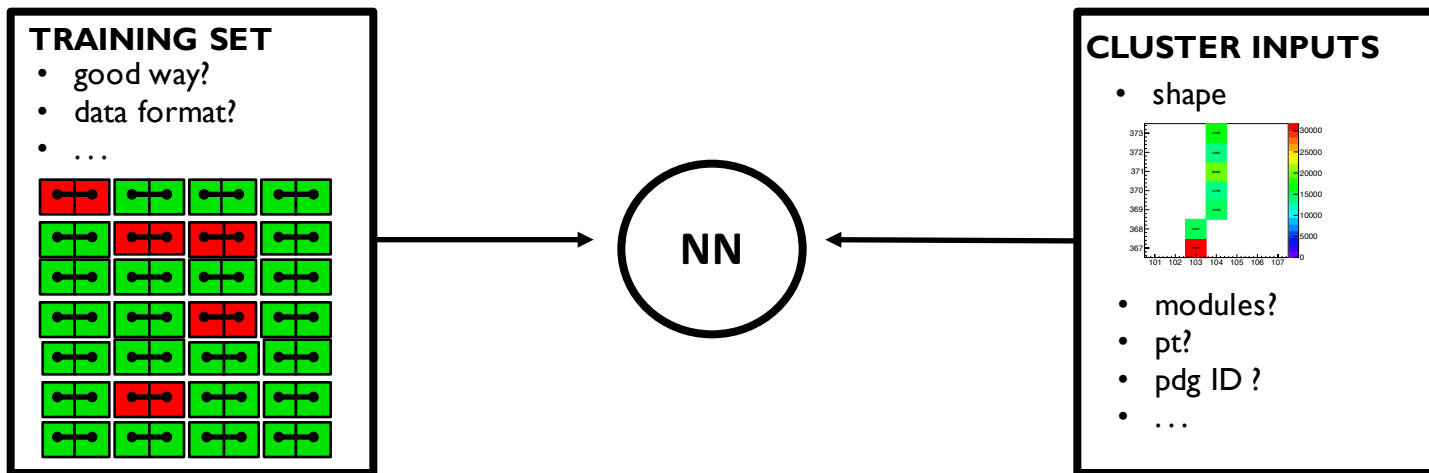
## CLUSTER INPUTS

- shape

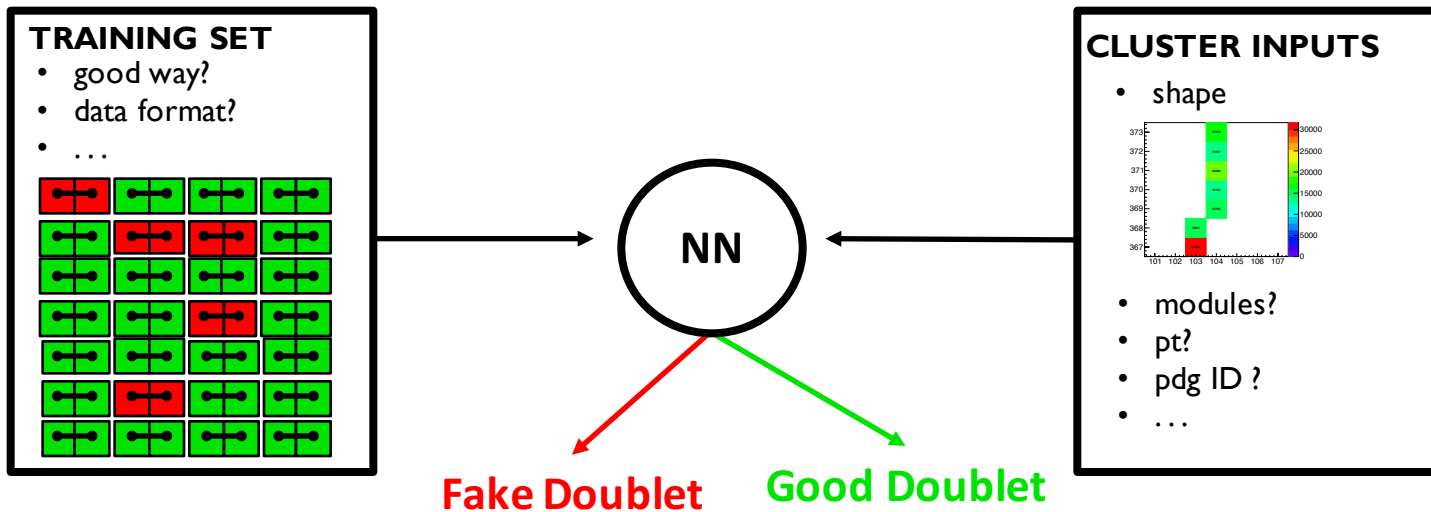


- modules?
- pt?
- pdg ID ?
- ...

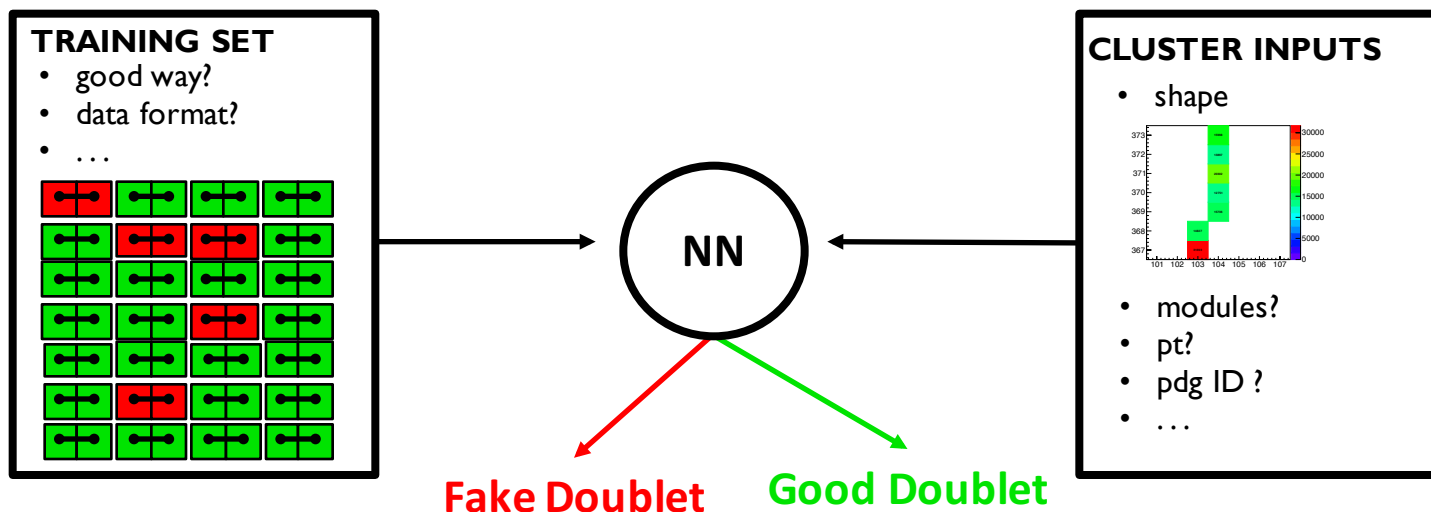
# The basic idea & next plans



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# The basic idea & next plans



*Just a glimpse . . .*

- supervised learning tuning
- build up an appropriate training dataset
- understand which inputs are useful
- how to deal with data
- any suggestion, criticism **well accepted!**





***Thank you***

*"I am putting myself to the fullest possible use, which is all I think that any conscious entity can ever hope to do"*

*HAL9000*