

# Updates to the Circle Hough Trackfinding Algorithm

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# Circle Hough Algorithm

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  - Generate all possible tracks
  - Accumulate track parameters
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  - Generate all possible tracks
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- CH Features
  - High efficiency
  - Flexibility
    - Applicable to all types of hits in the central detector
  - Robustness/stability
  - Intrinsic parallelism
  - Tuneability: computing vs physics performance
    - Online/offline: same algorithms with different working points
  - Hit association and extraction of track parameters at the same time
  - Information from STT isochrone radius taken into account

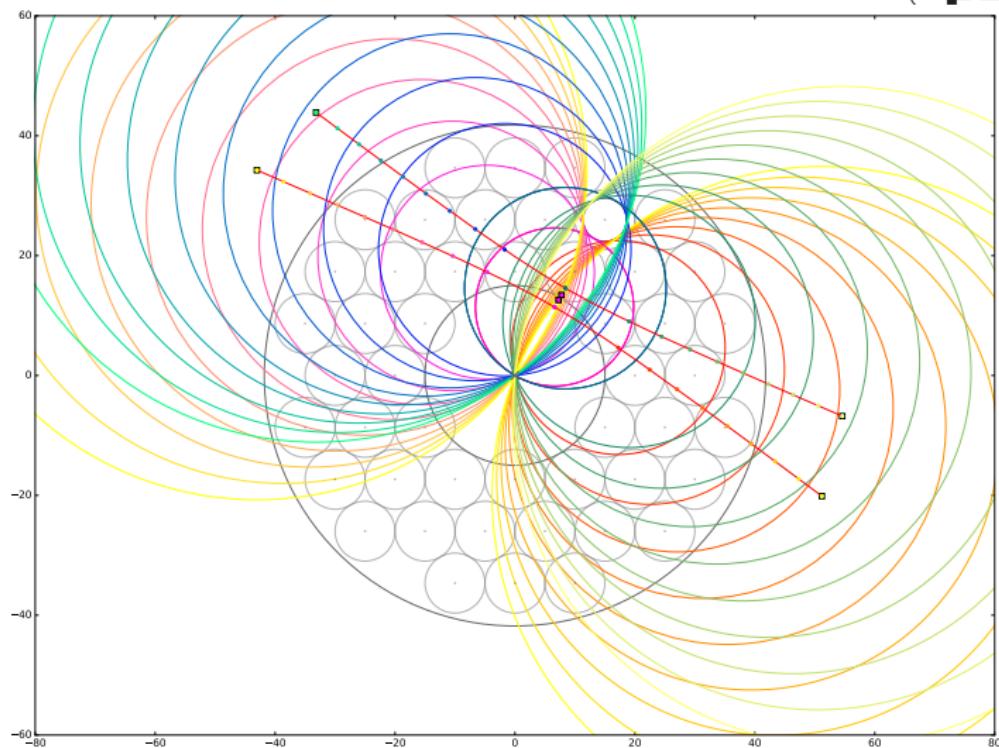
# CH: Principles

- Hough element: projection of primary track in the transverse plane  
     $\implies$  Circle passing through IP and hit
- Circle uniquely described by center: 2D parameter space
  - Use one parameter as sampling parameter
  - Calculate center coordinates from hit contact condition

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- 1 Direct calculation
- For each hit, calculate  $(x, y)$  from set of  $R$  values
  - Accumulate coordinates in  $(x, y)$  Accumulator Array

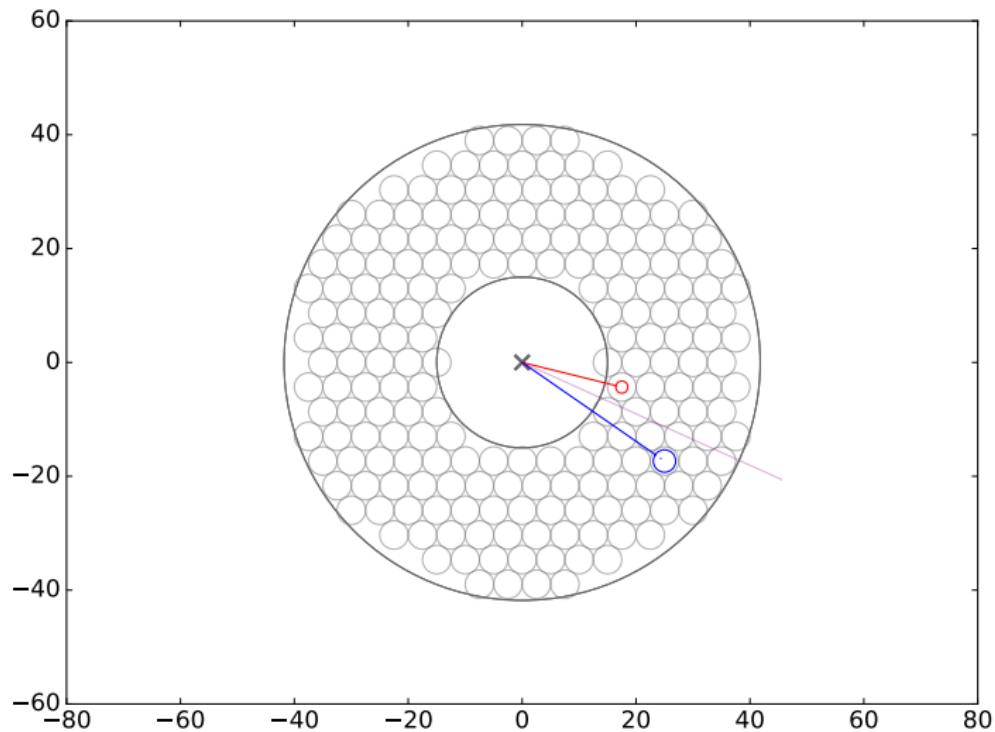
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- 1 Direct calculation
    - For each hit, calculate  $(x, y)$  from set of  $R$  values
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  - 2 Equation of circle centers known analytically
    - Locus is hyperbola or straight line
    - Accumulate parameters exploiting locus properties (rasterization, analytical intersection)

# CH: Principles

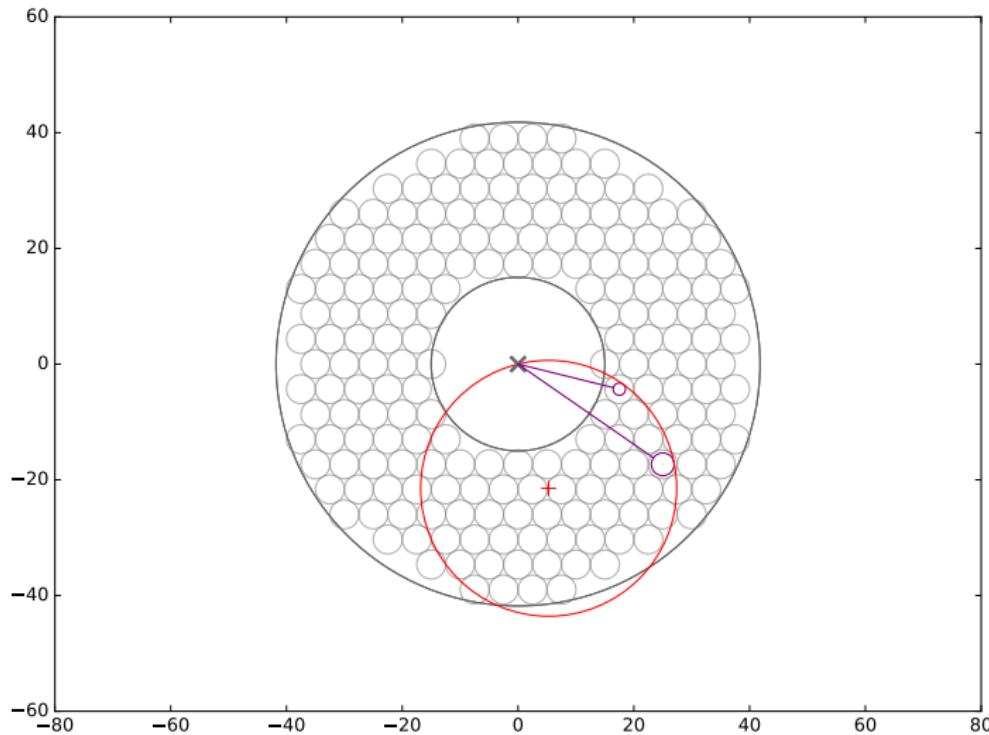


- Find intersections of Hough loci belonging to different hits
- ⇒ Consider directly **pairs of hits**
- Hough element: primary track compatible with two hits
  - ⇒ Circle passing through IP, tangent to two hits at the same time
- Explicit analytical solution: problem of Apollonius
  - “Given three circles, find circles tangent to all of them”
  - For primary tracks: one of the circles is IP (Apollonius PCC)
- Combinatorial complexity, but 1 fewer degree of freedom

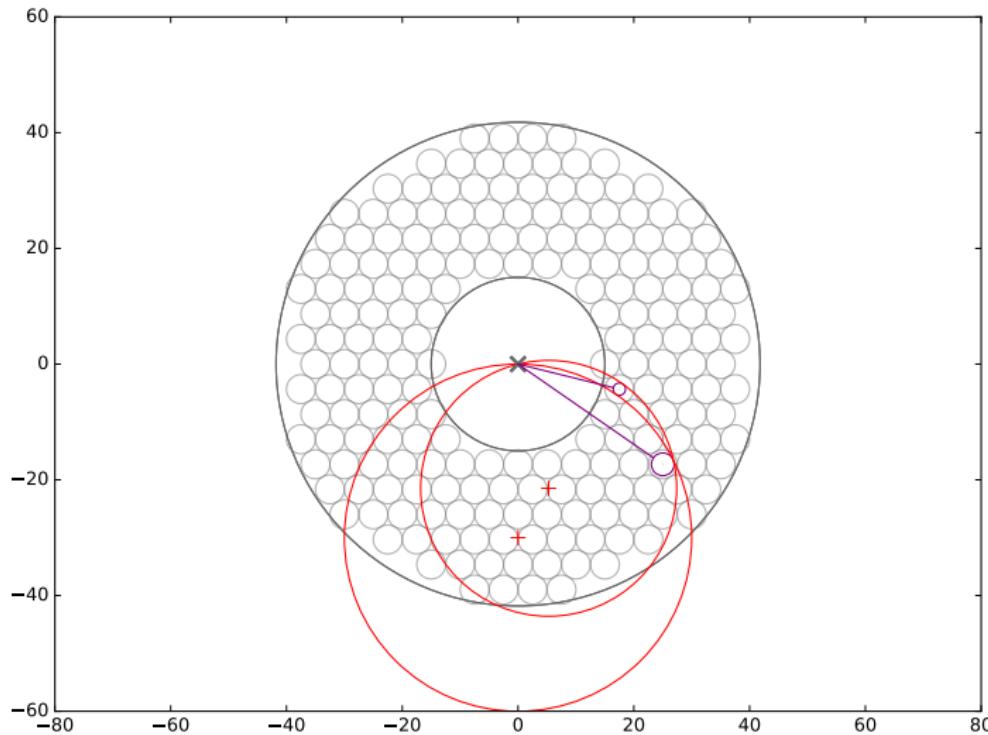
# Hit Pairs



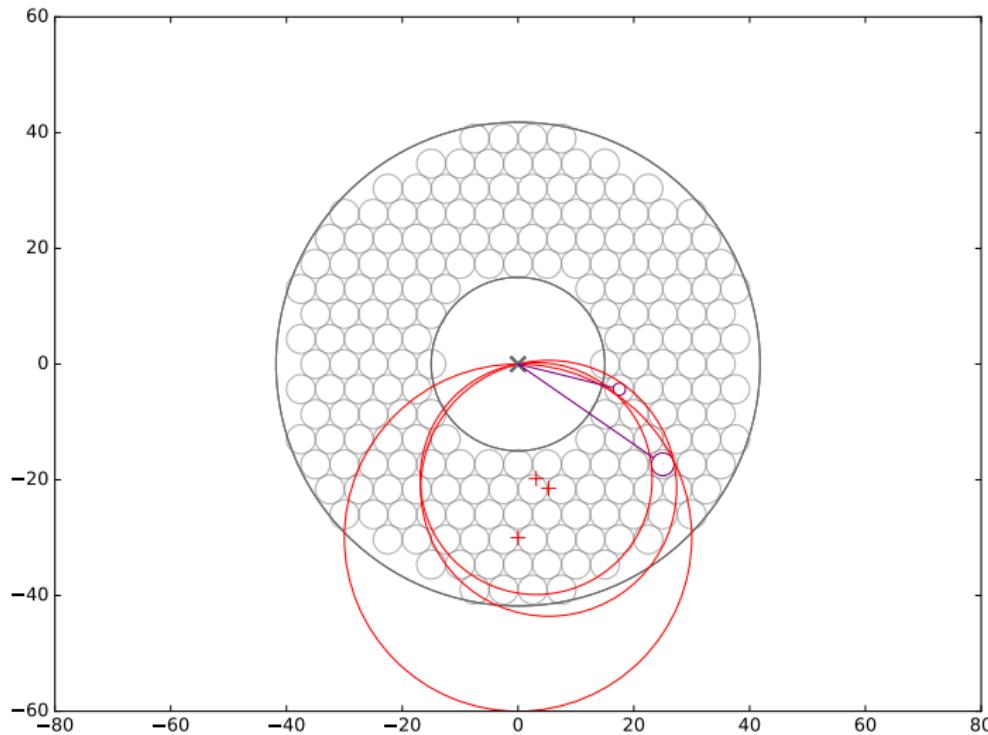
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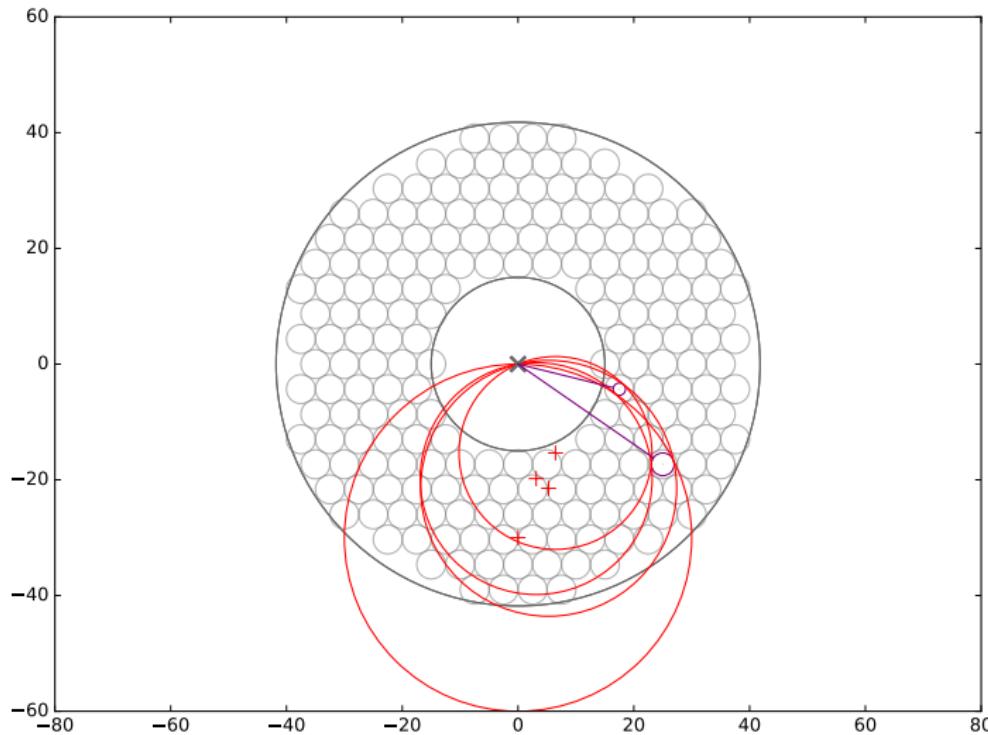
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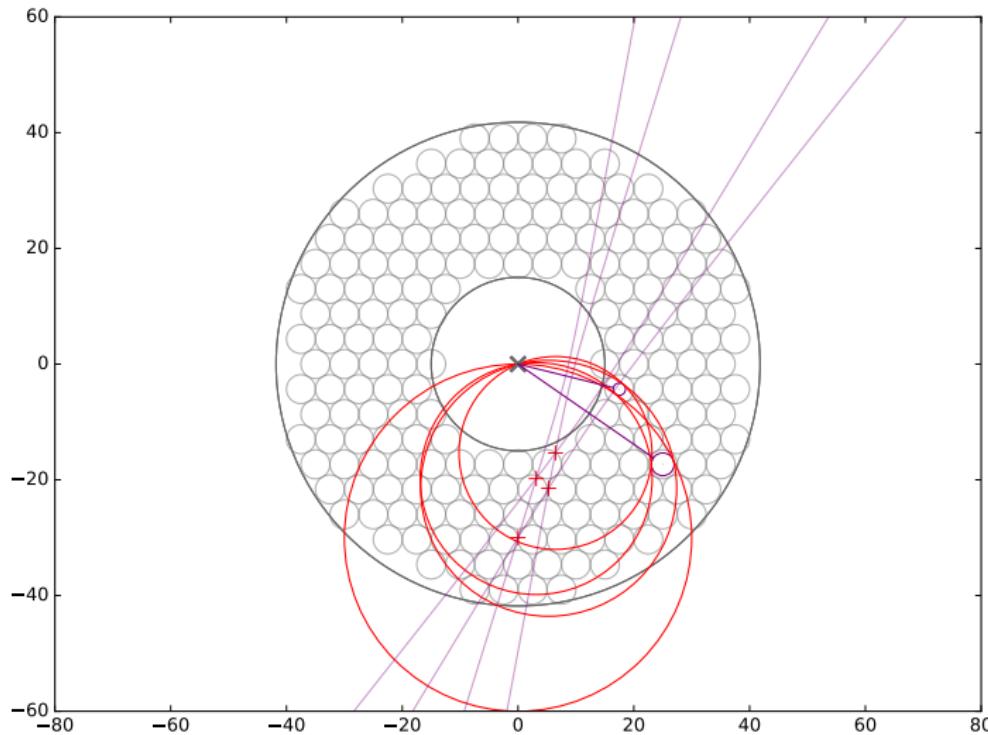
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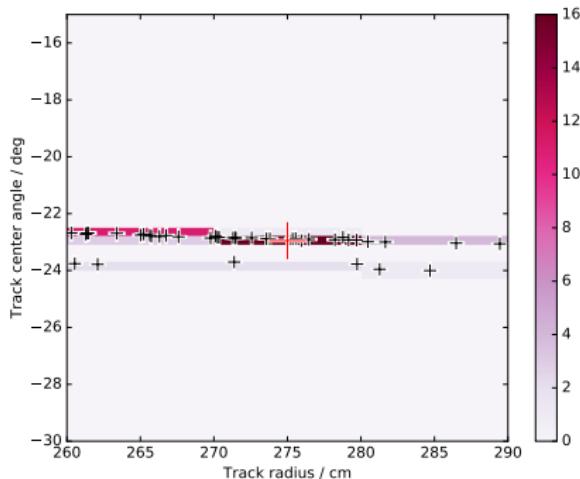


# Hit Pairs



# Hit Pair CH: Peakfinding

- Identify most likely track parameters
- Extract hit information from Hough elems in peak region
- Calculate track parameters from coordinates of peak region
- Basic strategy: 2D Accumulator Array (histogram) + peakfinding



# Hit Pair CH: Peakfinding

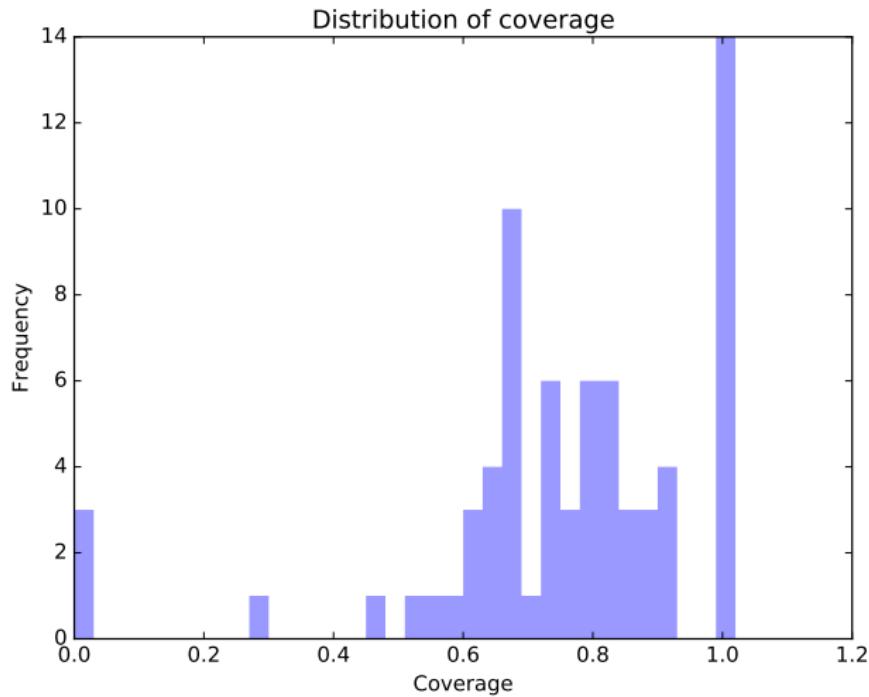
- Features of peakfinding
  - Hough elems aligned in  $\rho$  direction
  - “Critical density” close to the real peak
  - $(\rho, \varphi)$  less coupled for Hit Pair CH
- Strategies
  - 2D peakfinding: rel. threshold + local maximum
  - Also considered: “striped” peakfinding in parallel in one direction + combine with reduce/fold algorithm
- Caveats
  - Discrete binning causes artifacts and unstable behavior
  - Tune parameters
  - One simple solution:
    - 1 Use (binned) peakfinding to find location of peak
    - 2 Select (unbinned) Hough elems in interval centered on peak

# Testing the algorithm

- PandaRoot data
- Single tracks generated with BoxGenerator
- Useful for:
  - Algorithm exploration/optimization
  - Approximate indication for later, more accurate physics performance tests
- At this point, definitely not useful for:
  - Quoting performance numbers

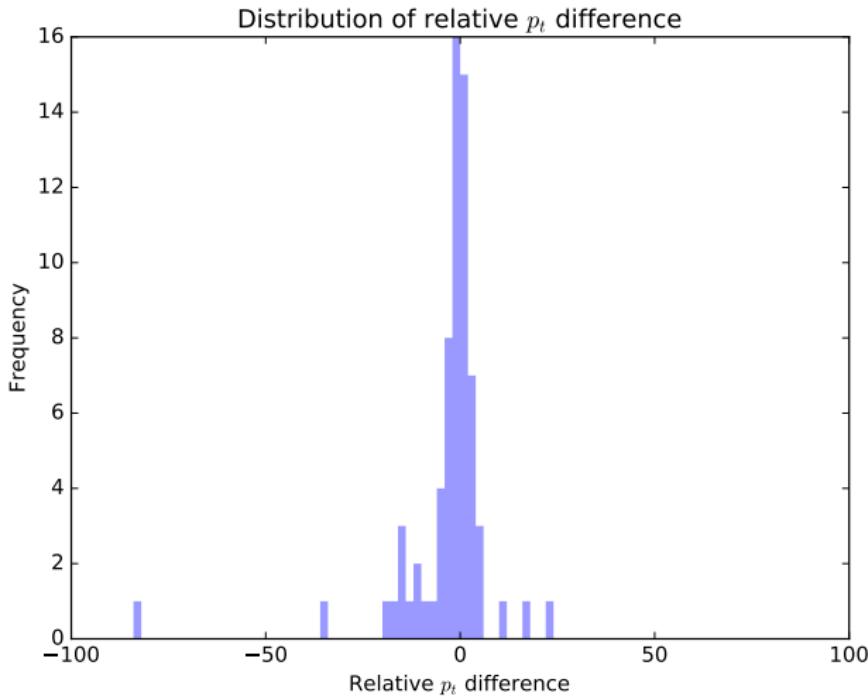
# Performance

Set of  $\sim 70$  tracks



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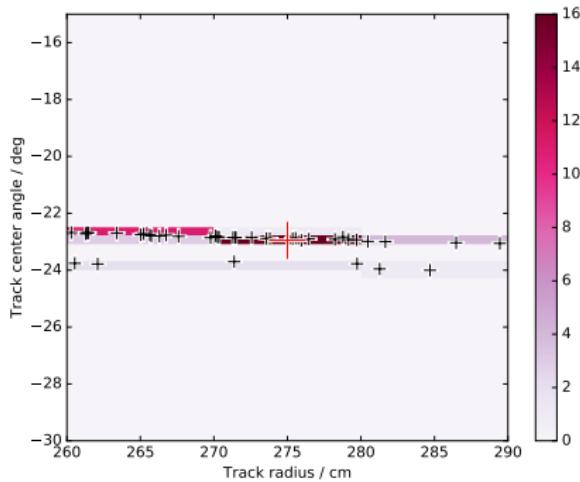
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# Parameter Study

## Width of $\rho$ Interval

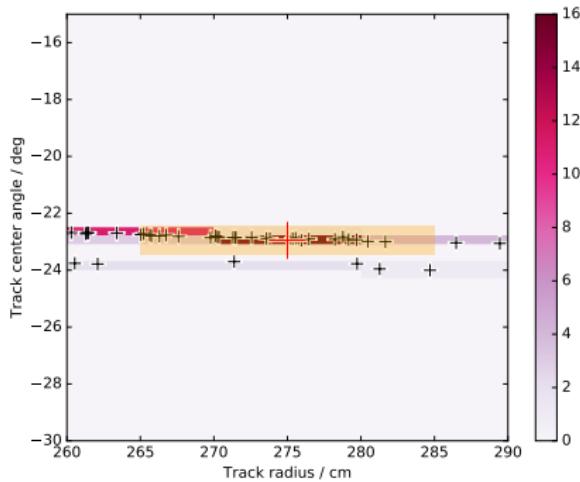
- Features of candidate tracks calculated by combining info from Hough elems in interval around peak position
- Main parameter: width of interval in  $\rho$  direction
- Tradeoff between: coverage, purity,  $p_t$  resolution, ...



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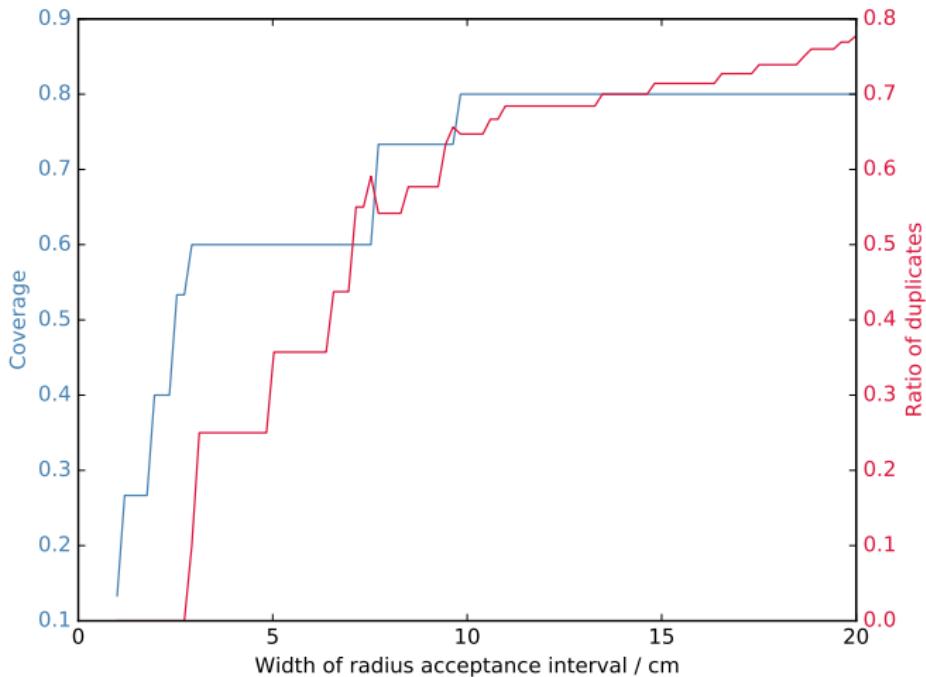
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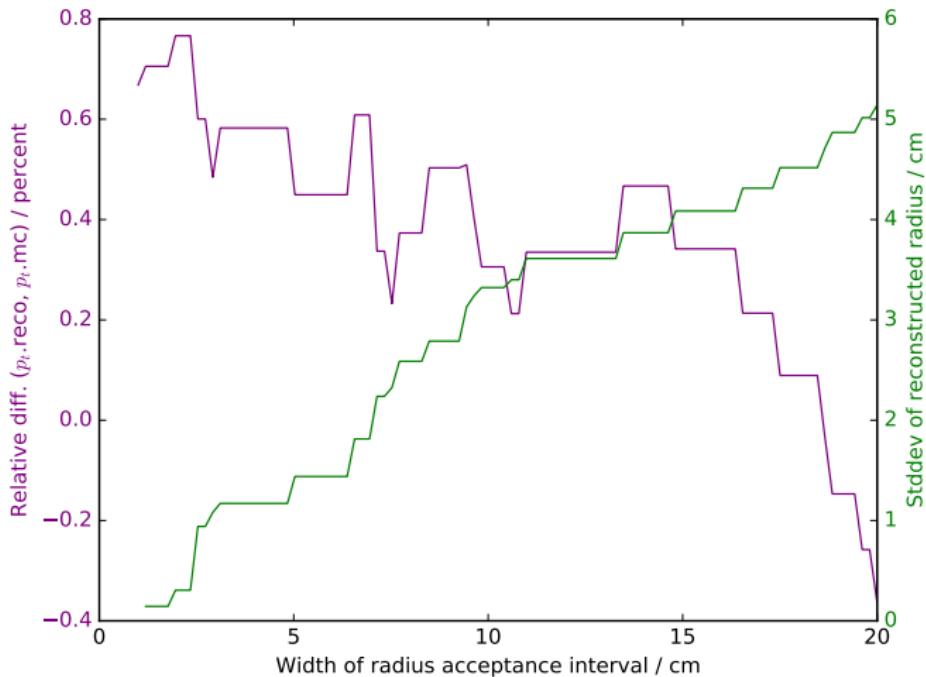
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Width of  $\rho$  Interval



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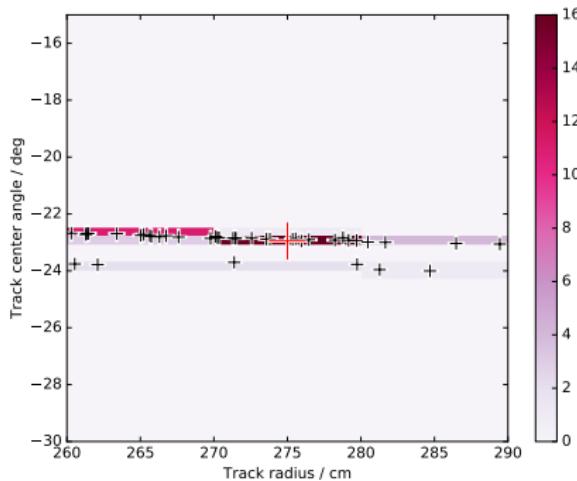
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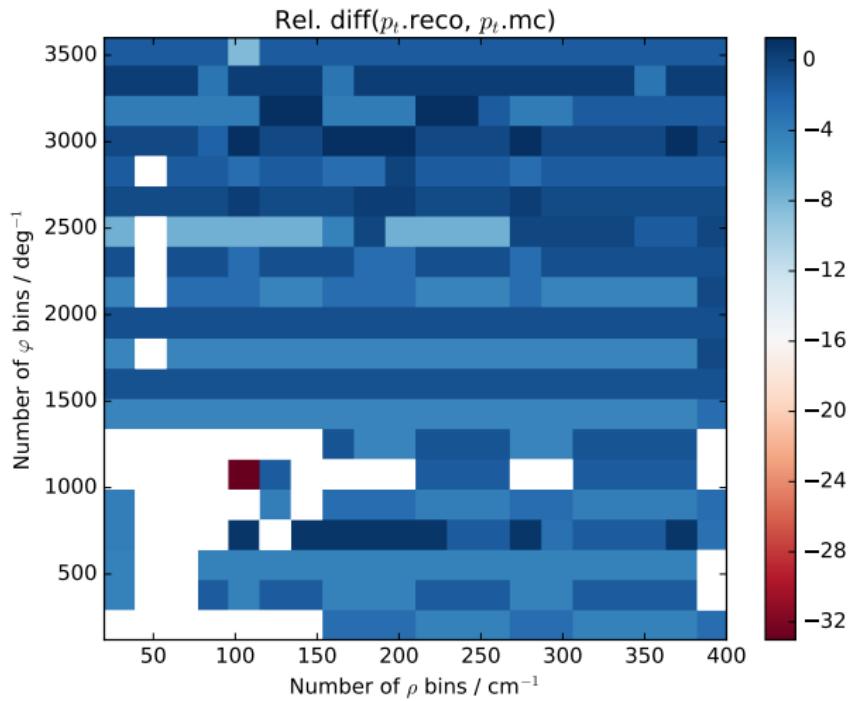
## $(\rho, \varphi)$ Bin Width

- Performance of peakfinding depends on binning of AA
- Vary  $N_\rho, N_\varphi$  at the same time
- Study impact of performance metrics on 2D grid



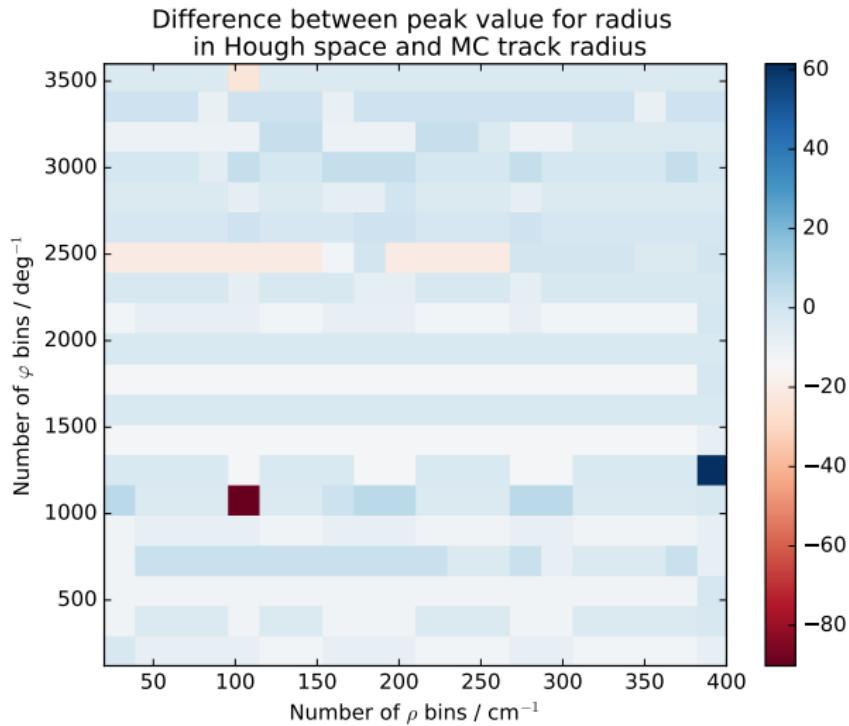
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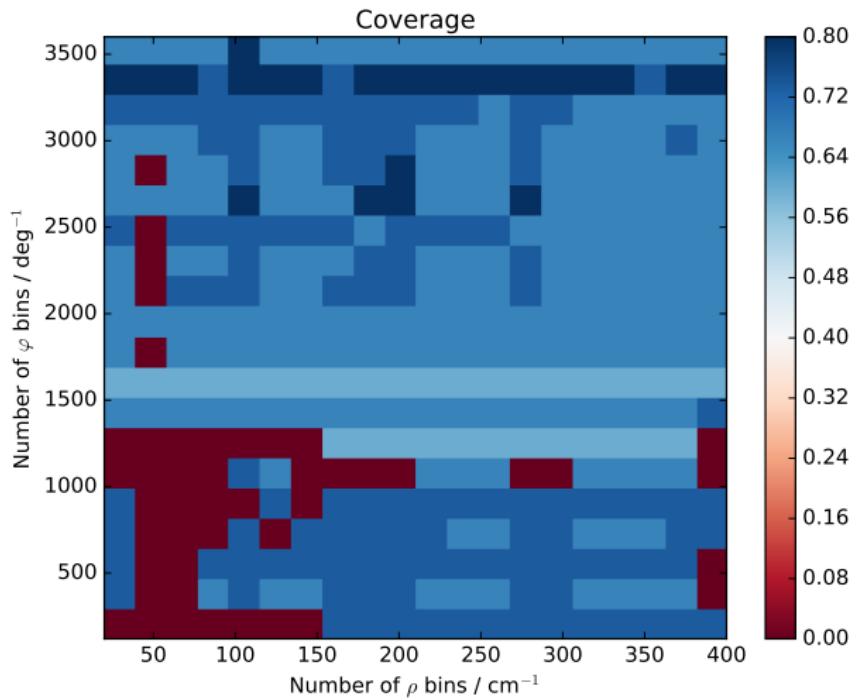
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$(\rho, \varphi)$  Bin Width



# Parameter Study

## Binning



# Summary & Outlook



- Work in progress
  - Characterization of algorithm
    - Exploration of parameter space
    - Optimization
    - Identify performance tradeoffs
  - Systematic testing with PandaRoot simulated data
    - Single tracks (`BoxGenerator`)
    - Full events (background; physics channels; ...)
- In the immediate future
  - Reference implementation of algorithm in C/C++
    - Identify performance bottlenecks  $\implies$  Parallelization targets
    - Integration with PandaRoot

Central idea: use one set of sampling values ( $R_0 \dots R_N$ ) for all hits

- Use radial coordinates  $(\rho, \varphi)$  of centers
  - Physically meaningful:  $\rho \propto p_t$
- Cells of AA in  $\rho$  direction coincide with  $R$  values
  - Peakfinding greatly simplified
  - Optimal patterns for filling in parallel (memory writes)
- Improve  $p_t$  resolution: “zooming in” recursively
  - Use same points in subregion of AA with finer density in  $\varphi$  direction