



SPRACE

Tracking Fit Studies

ANGELO SANTOS - 2020/06/24

SPRACE

Recent Results

Track Reconstruction

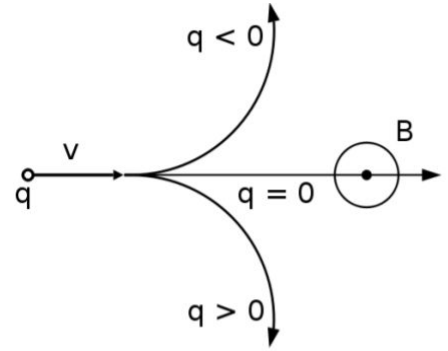
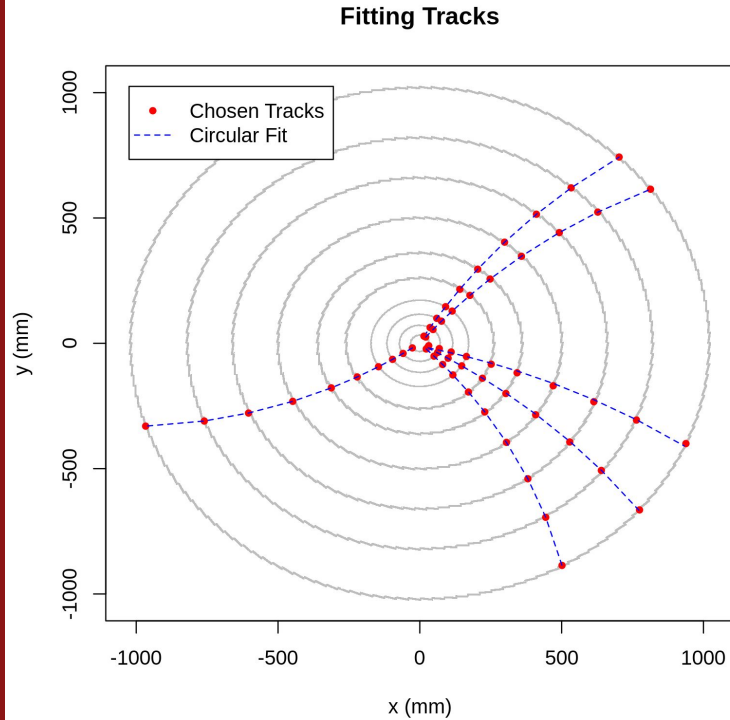
- Dataset (30k tracks)
 - $p_T > 1 \text{ GeV}/c$
 - $|\eta| < 0.5$
 - no ϕ cut
 - 10 hits per track
- Machine Learning Method
 - BDT-GBM ((x,y,z) coordinates)
 - 5th hit from previous 4 ones
 - Samples
 - Training: 21k tracks (70%)
 - Optimization: 3k tracks (10%)
 - Application: 6k tracks (20%)

Discussing about Failures

- Maybe failures are not that bad
- Failures to find a perfect track (according the Kaggle challenge)
 - does not mean a failure to find the particle features
 - and may be only due hits (from different tracks) very close to each other
- We can check it
 - comparing pT values between the dataset and a circle fit on the track

Update Dataset	Layers	5	6	7	8	9	10	Whole Track
Yes	Success	5026 (84%)	4815 (80%)	4626 (77%)	4272 (71%)	3793 (63%)	3552 (59%)	2411 (40%)
	Failure	974 (16%)	1185 (20%)	1374 (23%)	1728 (29%)	2207 (37%)	2448 (41%)	3589 (60%)
No	Success	5125 (85%)	5084 (85%)	5017 (84%)	4820 (80%)	4445 (74%)	4426 (74%)	3280 (55%)
	Failure	875 (15%)	916 (15%)	983 (16%)	1180 (20%)	1555 (26%)	1574 (26%)	2720 (45%)

Tracking Fit



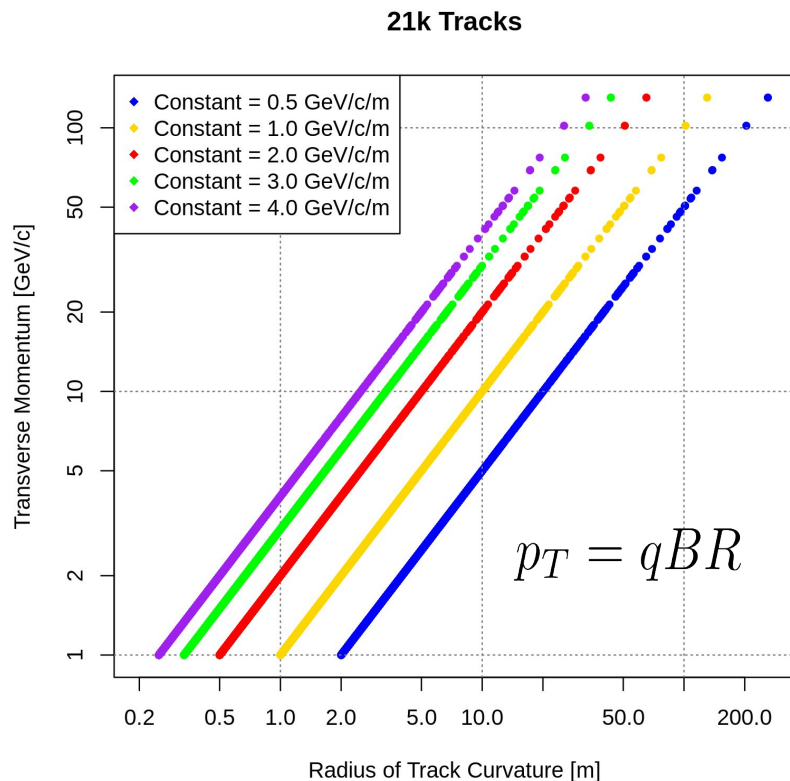
$$p(x, y) = \sqrt{p_x^2 + p_y^2} \equiv p_T$$

$$p_T = qBR$$

$$\frac{p_T}{R} = q \cdot B = \text{constant}$$

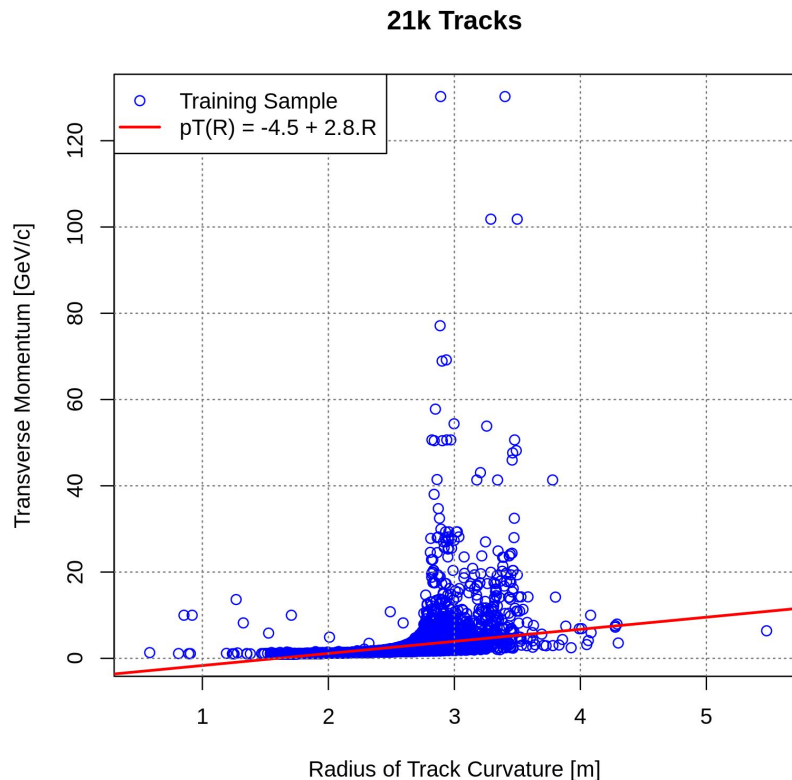
Constant value
would come
from a fit in
 p_T vs. R

Phenomenology Expectations



- What would we expect to get from?
 - A line consistently increasing
 - A smooth line
 - Highest radius less than 300 m
 - The higher pT, less points

Unexpected Result from a Circular Fit



- But real life is hard
- Two different scenarios
 - Points
 - consistently increasing
 - in a smooth line
 - Points
 - insensitive to the formers
 - without any structure
- Highest radius
 - lower than 6 m
- Constant = 2.8 GeV/c/m
 - Highest expected radius: 40 m

Unexpected Tracking Fit: Hypophysis

- Failure to fit tracks
 - R library (circular) may not be good enough
 - Would be the best scenario (unfortunately)
- Presence of outliers
 - But are not expected to be so much
- The constant is not a constant
 - It is a residual assumption
 - But must to be considered if the two first hypophysis are not confirmed

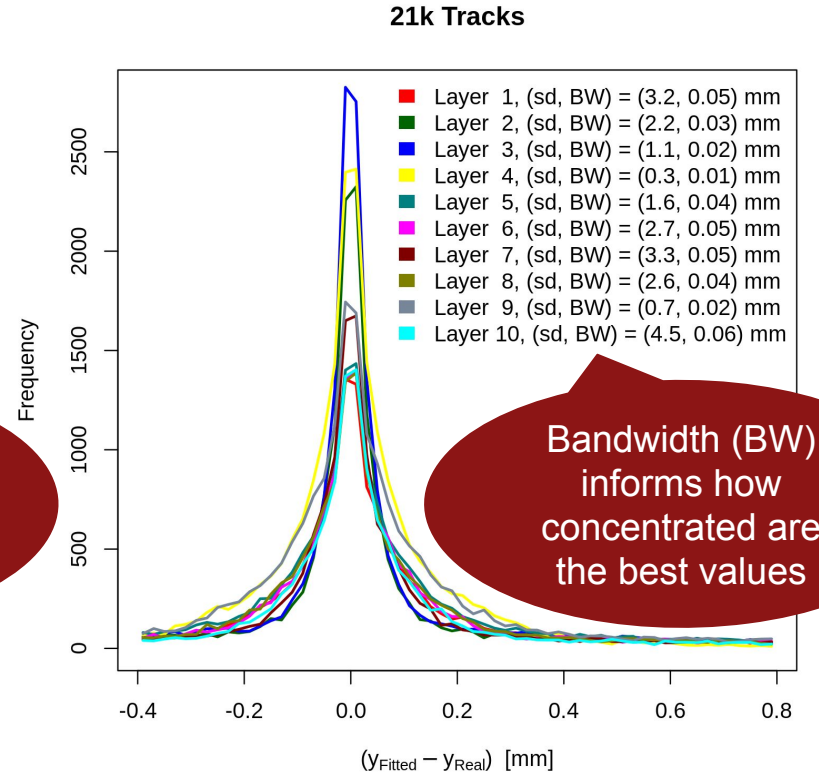
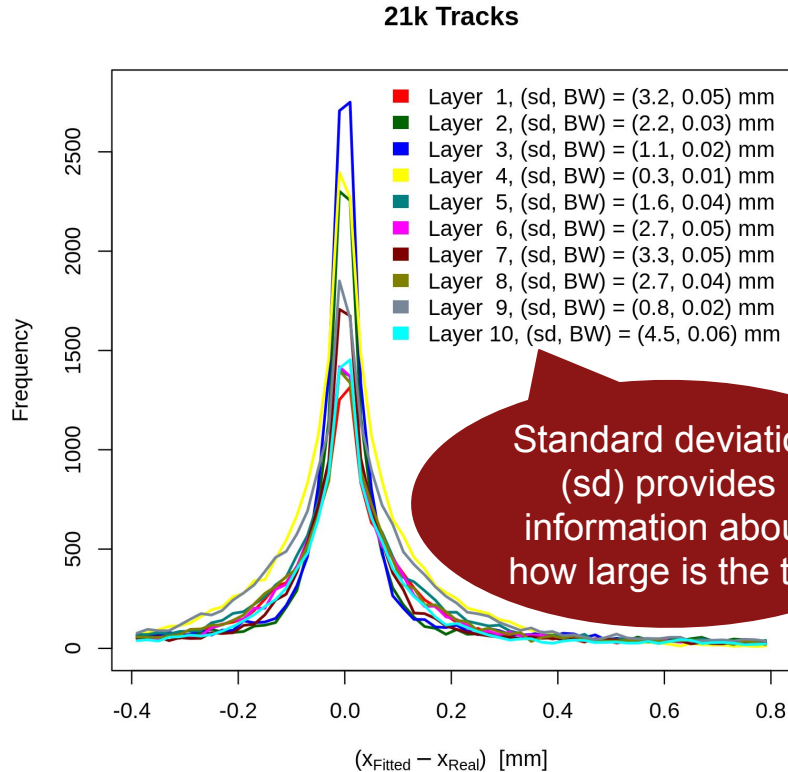
Checking Fit

```
# R
```

```
> library(circular)
```

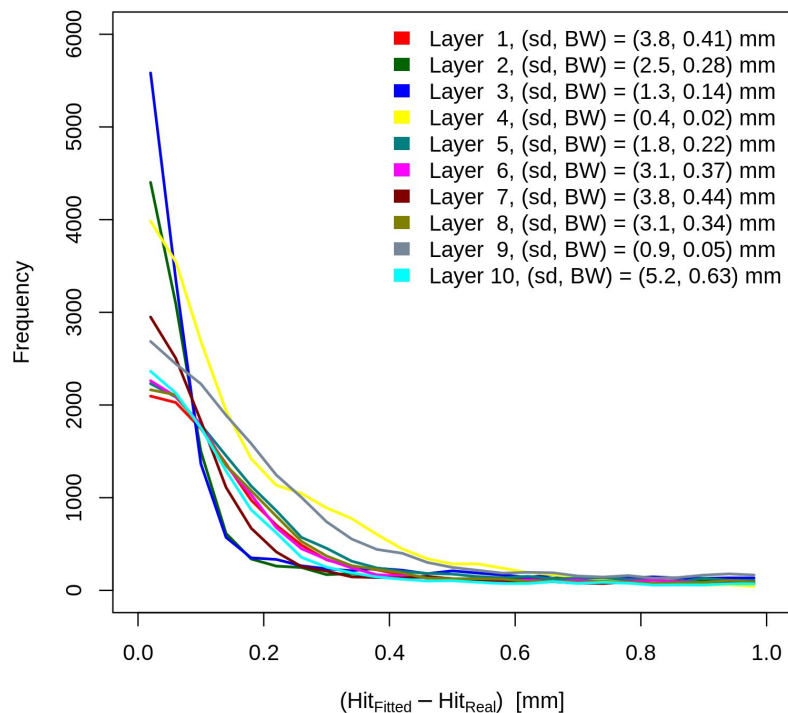
- It is mandatory to analyze how far/close
 - points from tracking fit
 - are from real hits

X-Y: Distance between Fitted and Real Points

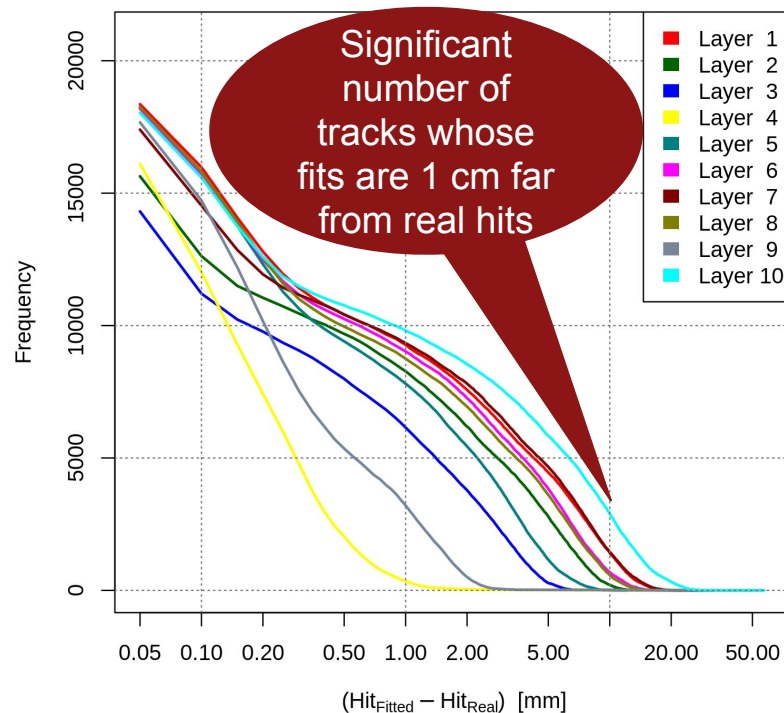


2D Distance between Fitted and Real Points

Distance between $\text{Hit}_{\text{Fitted}}$ and Hit_{Real} in XY Plane

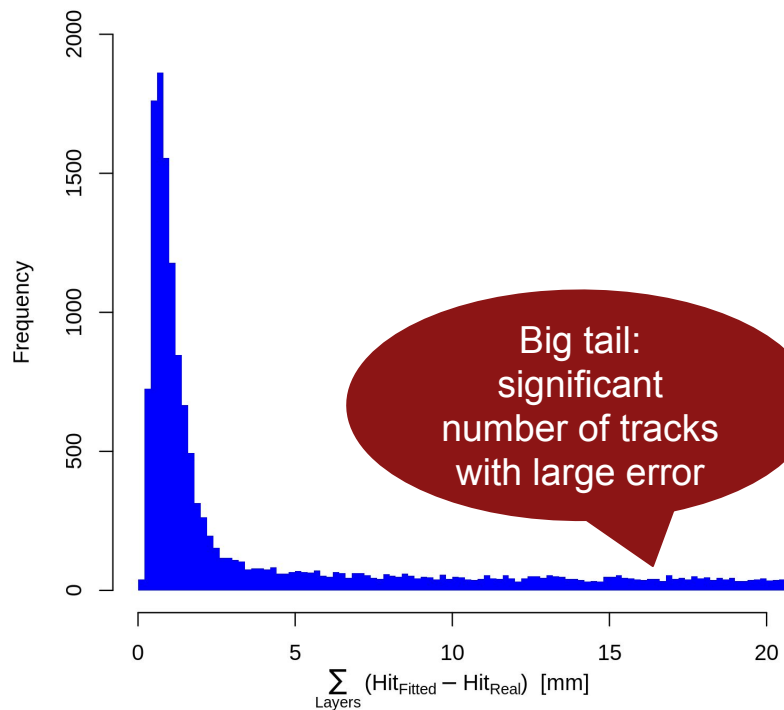


Number of Fits Out of Difference ($\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}$)

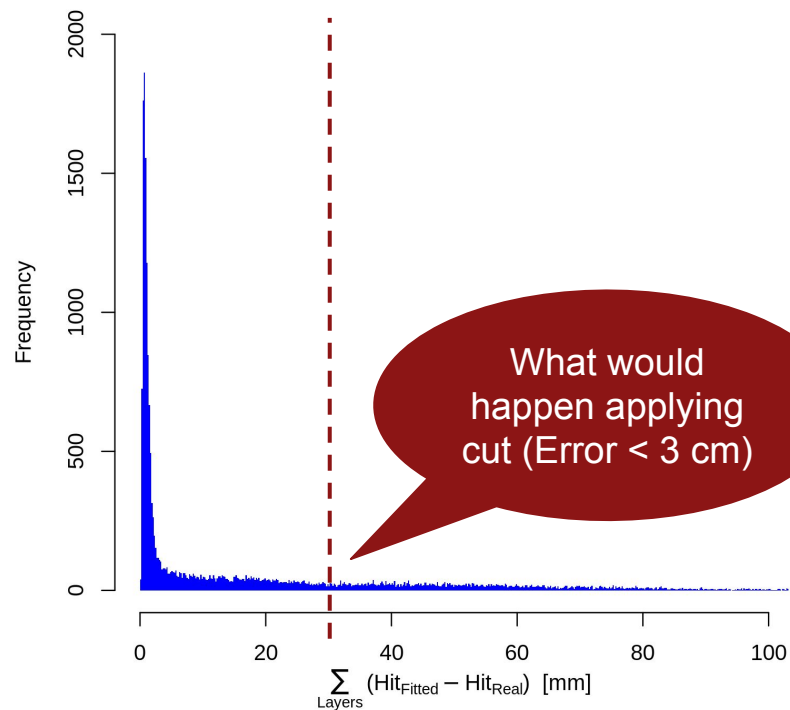


Summing Errors over All Hits in Track

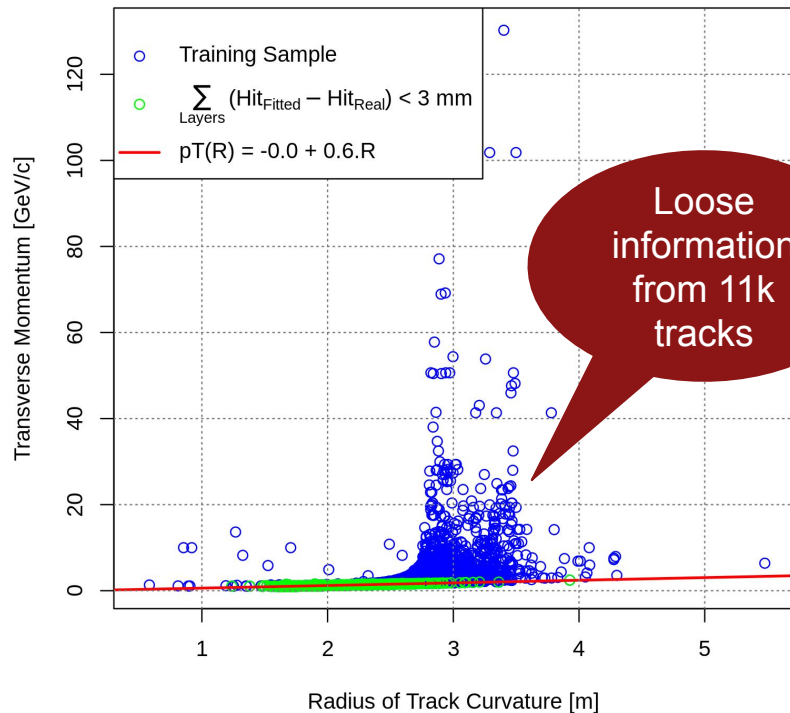
21k Tracks



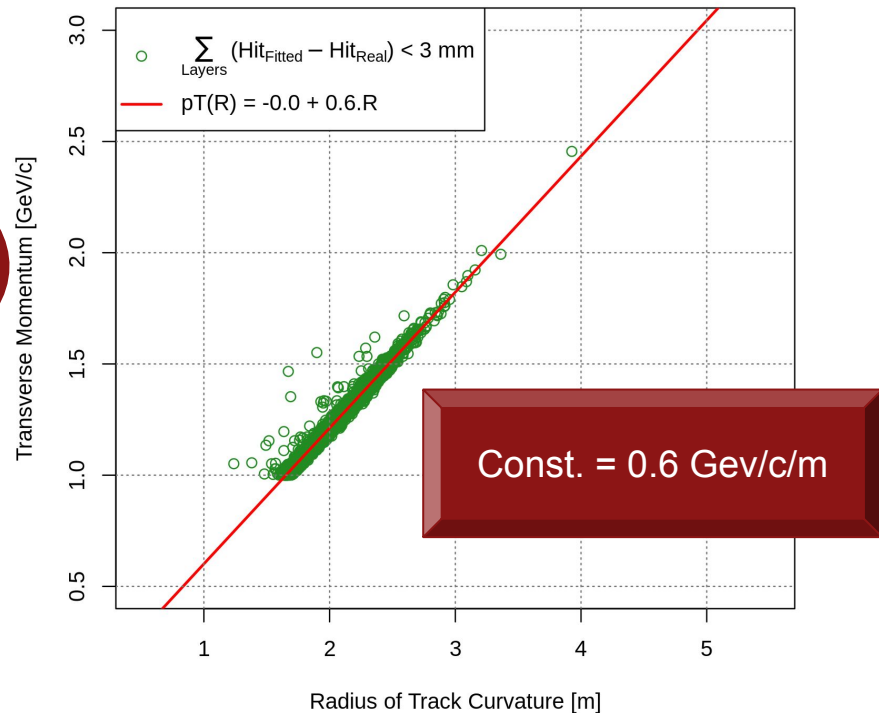
21k Tracks



Before and After $\sum_{\text{Layers}} (\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}) < 3 \text{ mm}$

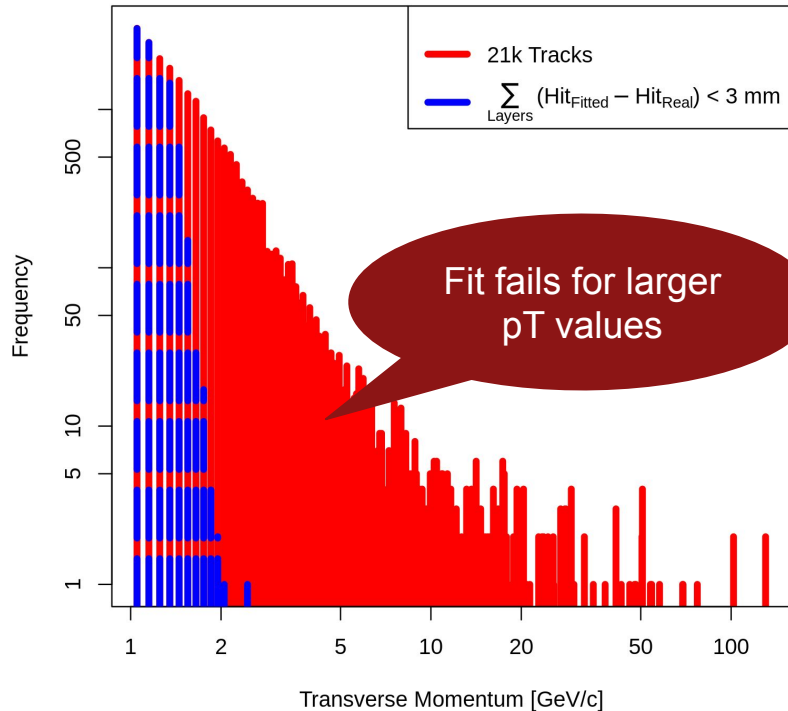


10k Tracks

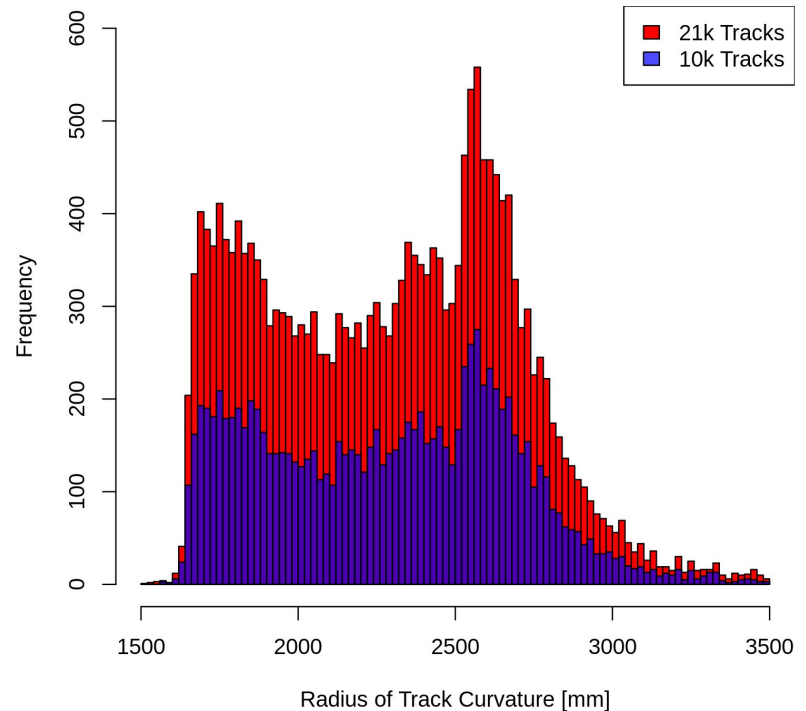


Cutting Out Cases with Larger Fit Error

Before and After Cut in $\sum_{\text{Layers}} (\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$



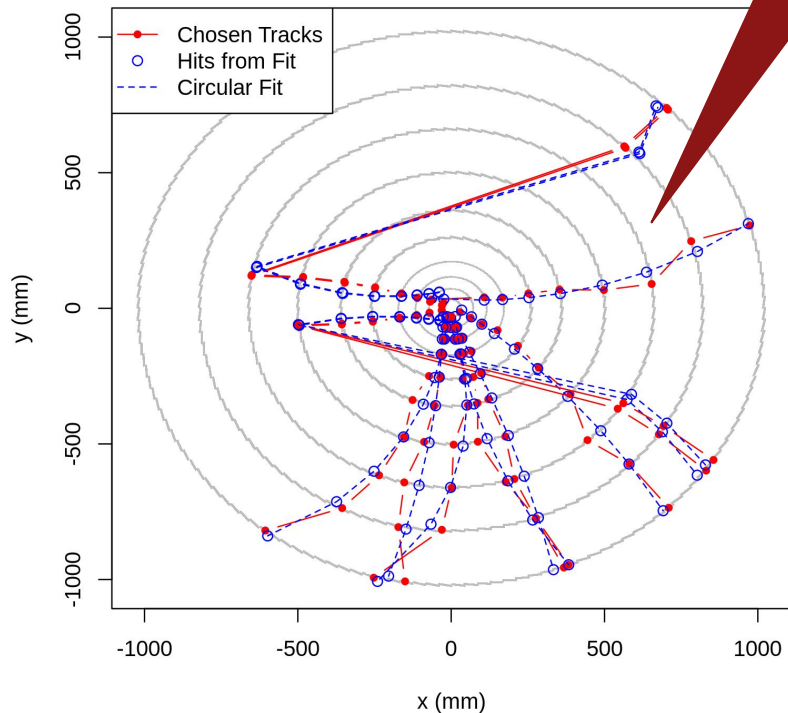
Before and After Cut in $\sum_{\text{Layers}} (\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$



Fit Failures

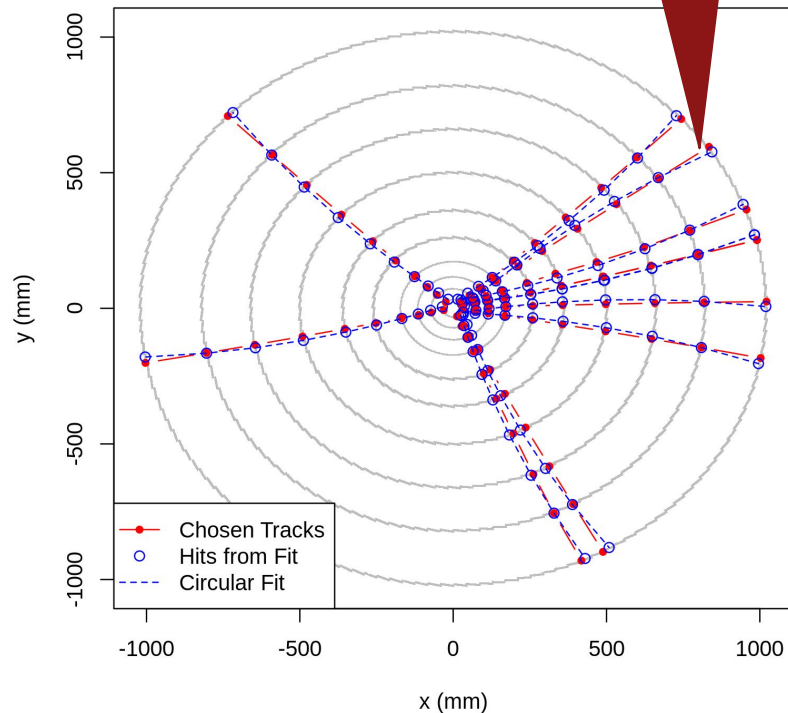
Yes!
There are some
outliers

Fitting Tracks with $(\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}) > 30 \text{ mm}$



Fit fails for
larger p_T
values: larger
track curvature

Fitting Tracks ($p_T > 10 \text{ GeV}/c$)

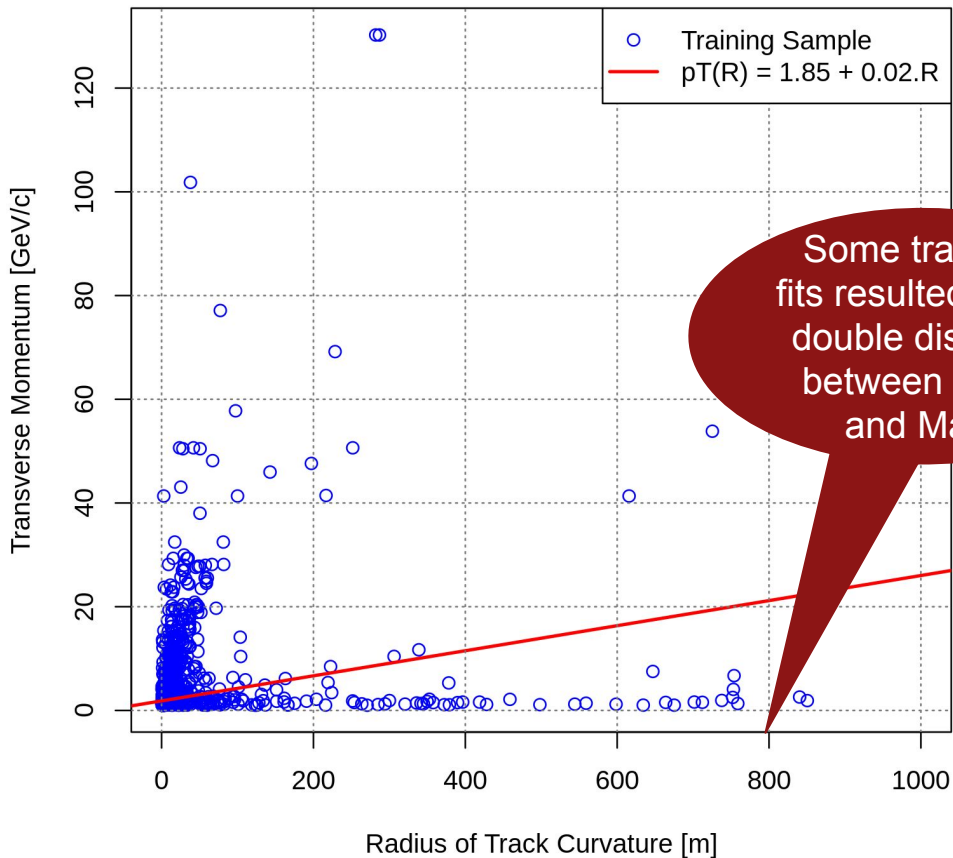


Trying with Other Library

R

```
> library(pracma)
```

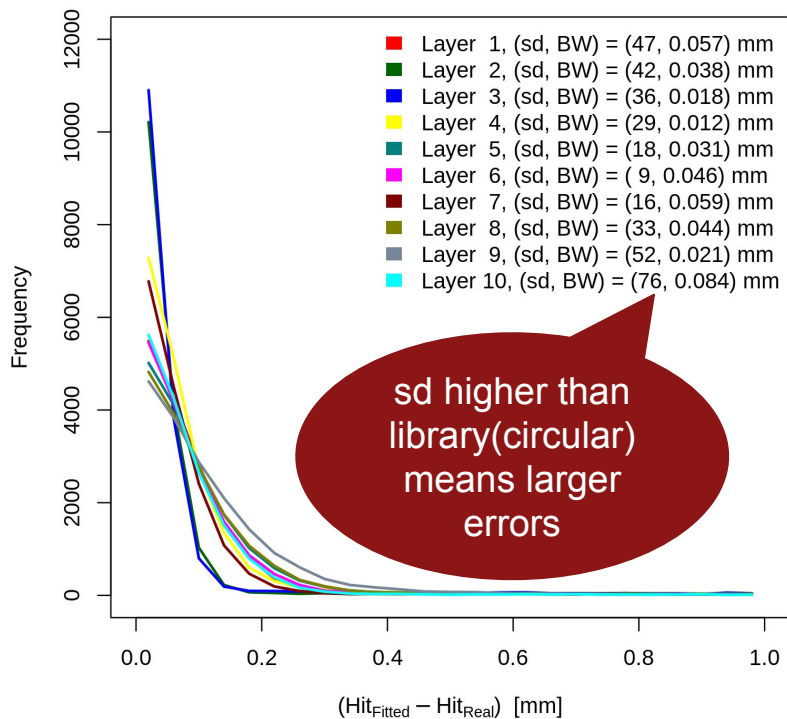
21k Tracks



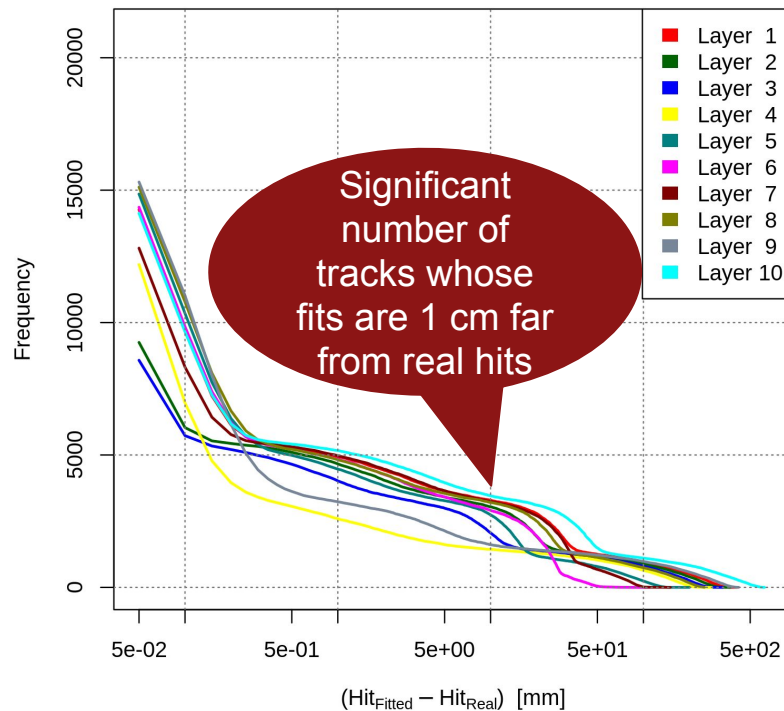
Some tracking fits resulted in the double distance between Earth and Mars

2D Sum of Errors

Distance between $\text{Hit}_{\text{Fitted}}$ and Hit_{Real} in XY Plane

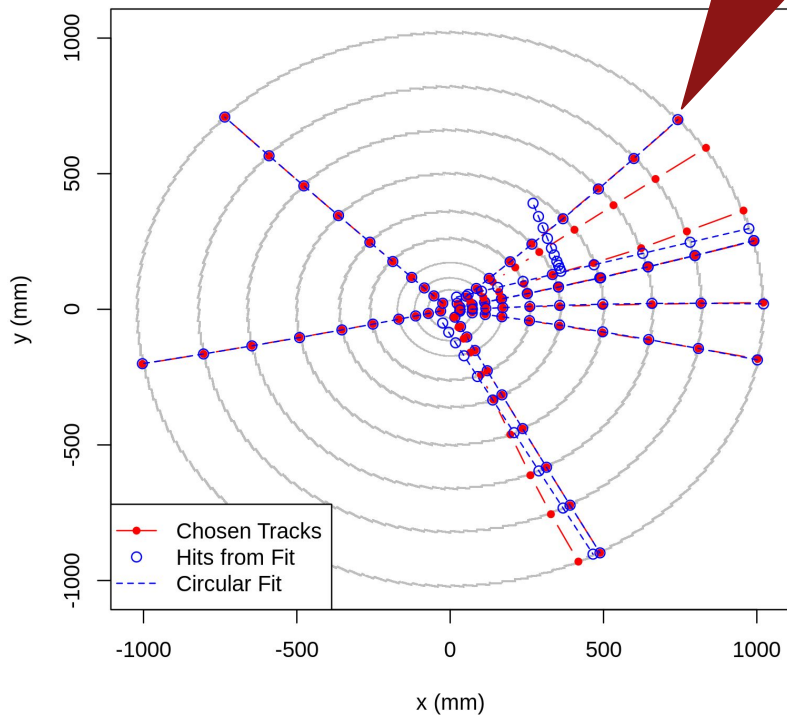


Number of Fits Out of Difference ($\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}$)



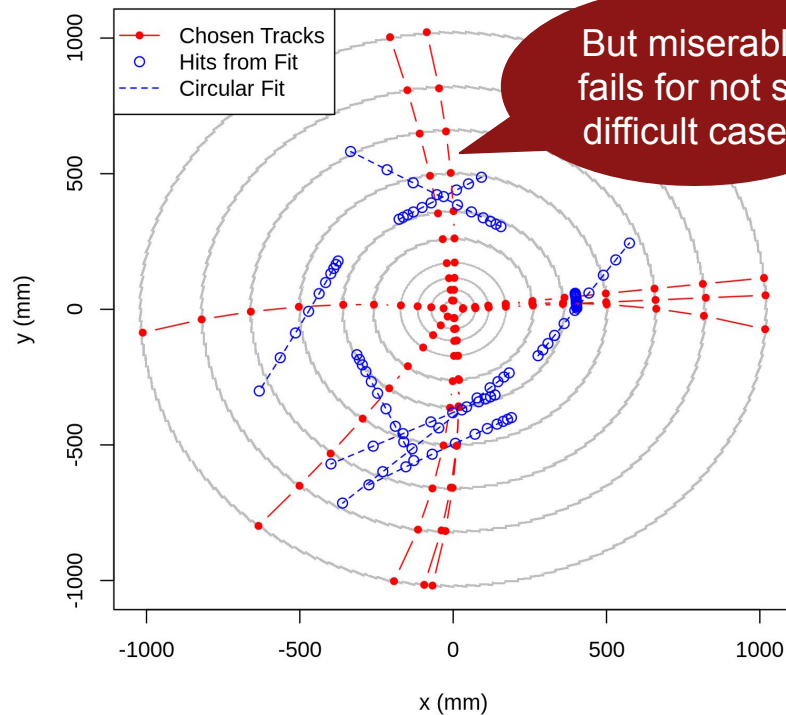
Checking Fits

Fitting Tracks ($p_T > 10$ GeV/c)



Works fine for
larger tracking
curvature

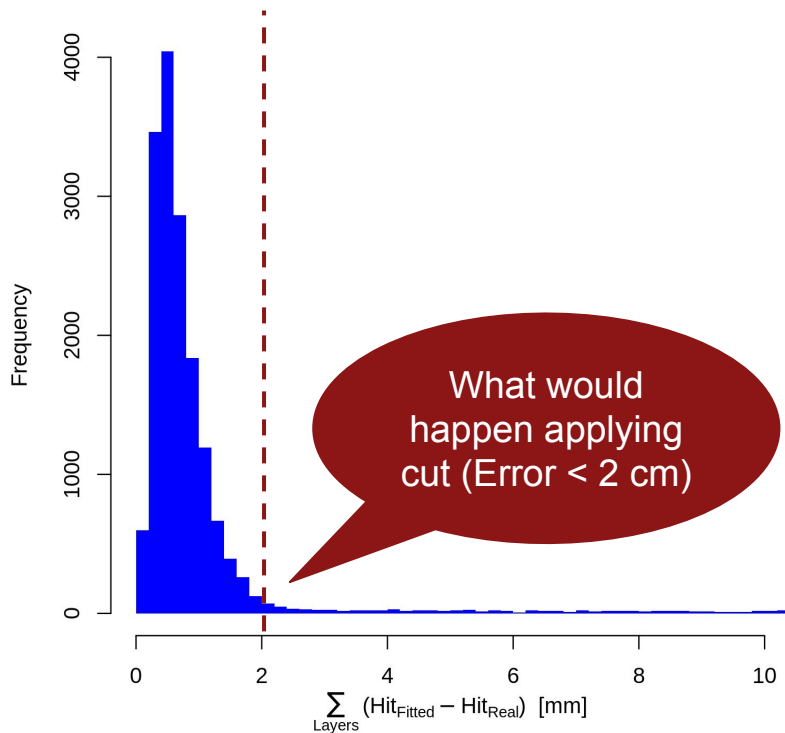
Fitting Tracks with $(\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}) > 30$ mm



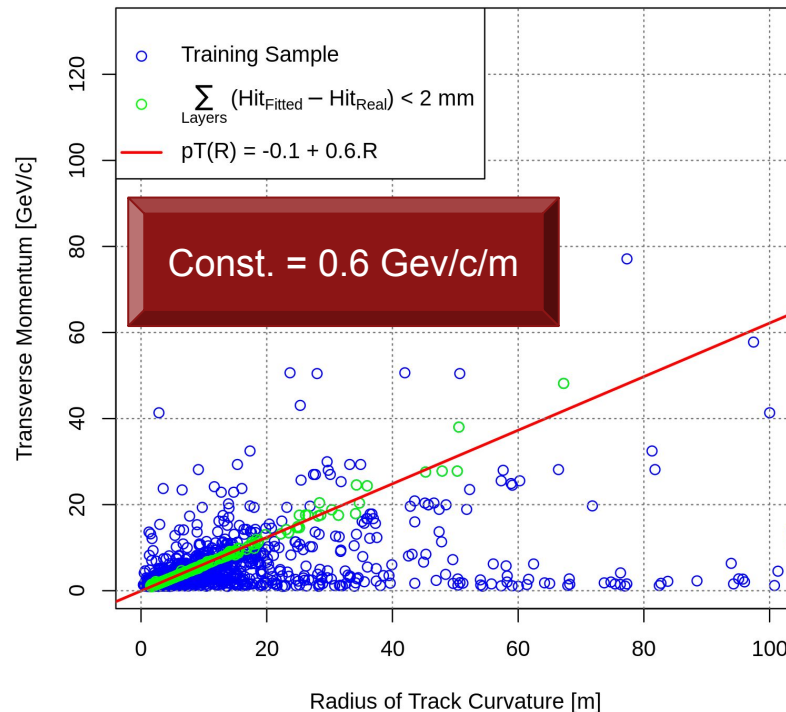
But miserably
fails for not so
difficult cases

Summing Errors over All Hits in Track

21k Tracks

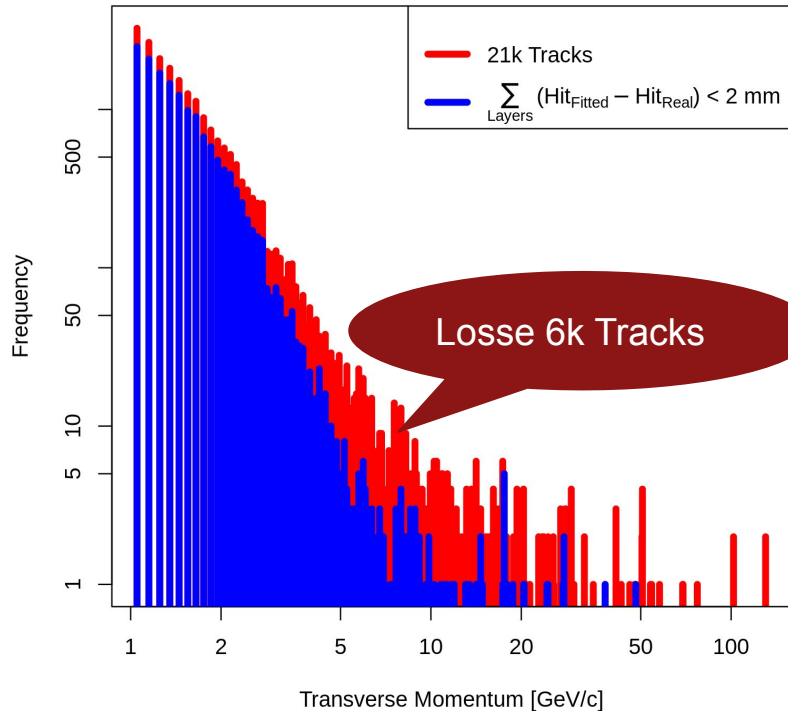


Before and After $\sum_{\text{Layers}} (\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}) < 2 \text{ mm}$

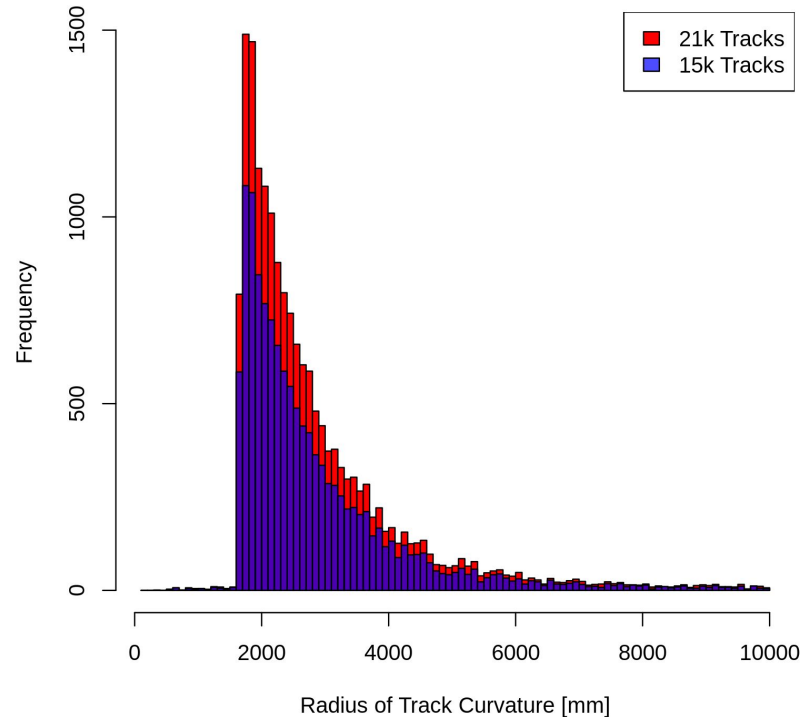


Cutting Out Cases with Larger Fit Error

Before and After Cut in $\sum_{\text{Layers}} (\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$



Before and After Cut in $\sum_{\text{Layers}} (\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$



Solution to Computing Constant

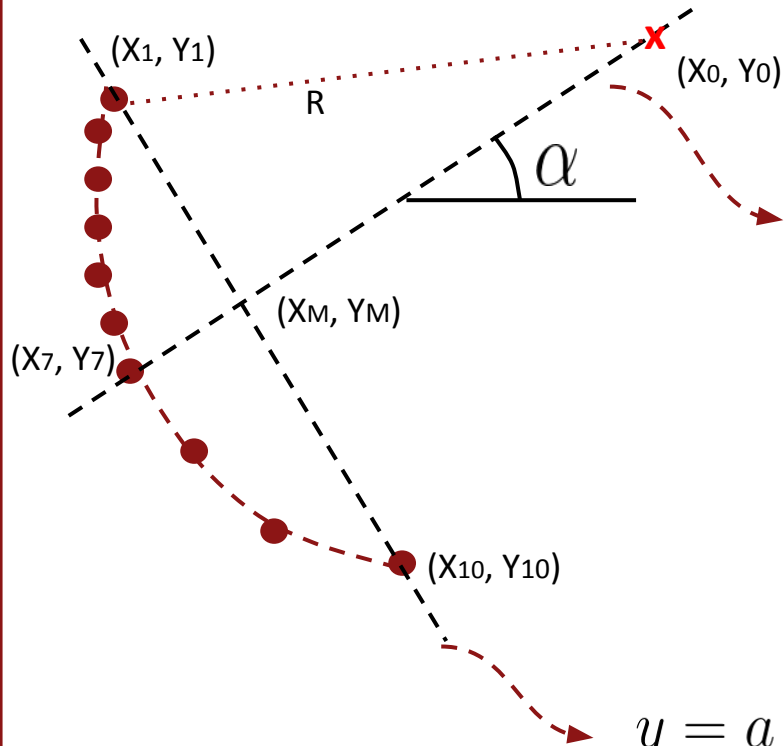
- Library “pracma” is very simple
 - Does not allow to set initial (r, x0, y0)
- Library “circular” is more complete
 - Allow to inform to set initial (r, x0, y0)
 - Providing triplet may be helpful

$$R_i = \frac{p_T}{k_i}, k_i = \underbrace{\{0.2, 0.4, 0.6, \dots, 4.0\}}_{\text{20 different constant values}} \times 10^{-3} \frac{\text{GeV}/c}{\text{mm}}$$

20 different
constant values

- However
 - Radius is computed from pT
 - What about circumference center (x0, y0)?

Computing Center of the Circumference



$$x_0 = x_7 \pm R \cdot \cos(\alpha)$$

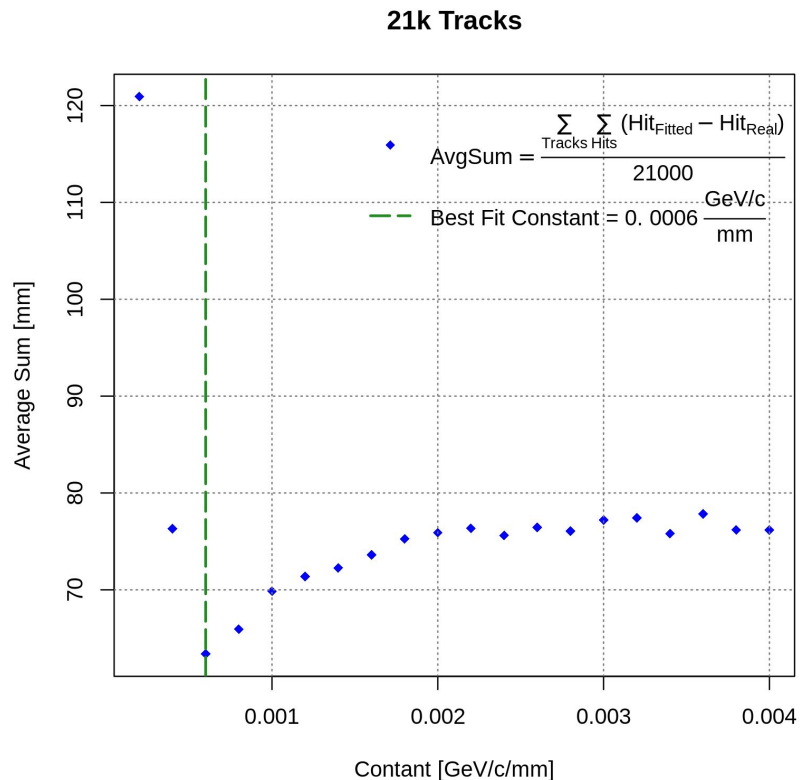
$$y_0 = y_7 \pm R \cdot \sin(\alpha)$$

$$y' = a' + b' \cdot x$$

$$b' = \arctan\left(-\left(\frac{x_{10} - x_1}{y_{10} - y_1}\right)\right)$$

$$y = a + b \cdot x \quad b = \arctan\left(\frac{y_{10} - y_1}{x_{10} - x_1}\right)$$

Find Best Constant Value



- $q.B = 0.6 \text{ GeV}/c/m$

- For High Energy Physics

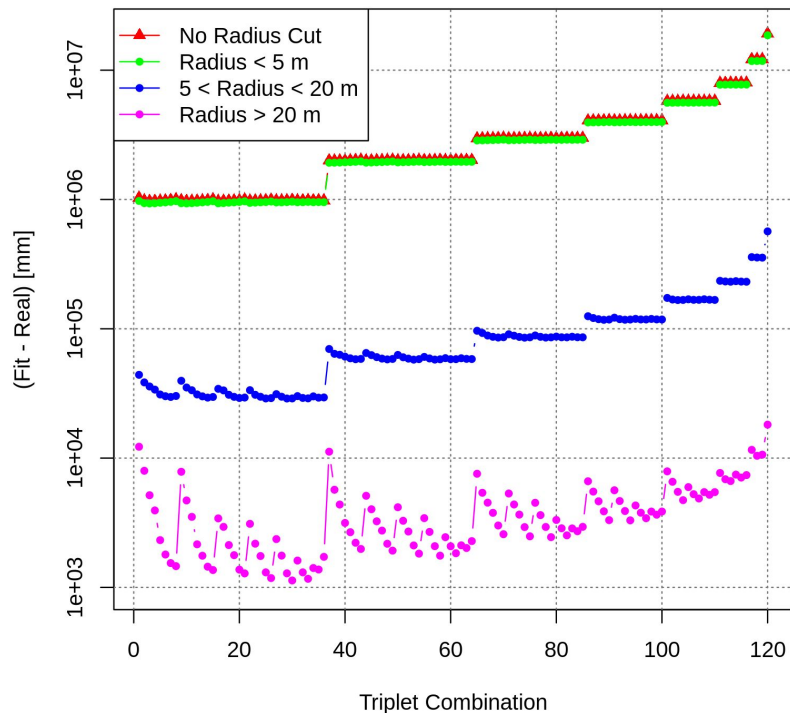
- $e = \sqrt{(4\pi\alpha)} \cdot \sqrt{(\hbar c)}$
 $= 0.30282212088 \sqrt{(\hbar c)}$

My solution for Tracking Fit

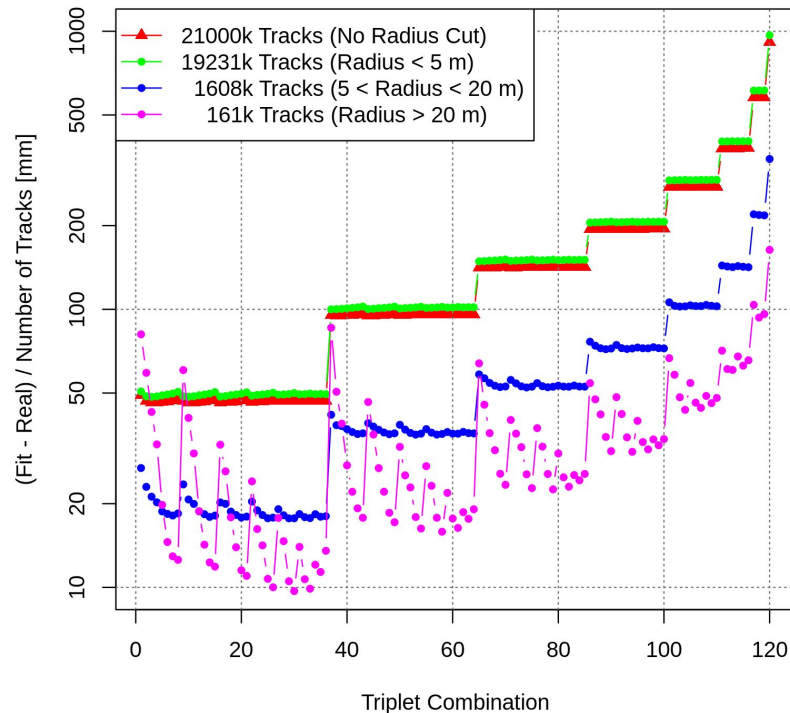


Find Best Triplet Combinations (H_1, H_2, H_3)

$\sum(\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$ vs. Triplet Combination

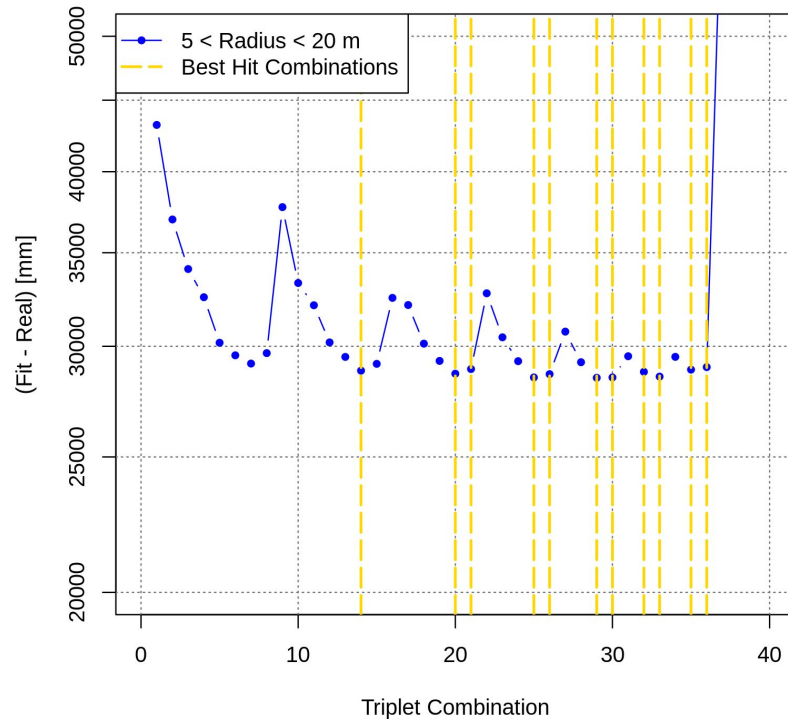


Avg. of $\sum(\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$ vs. Triplet Combination

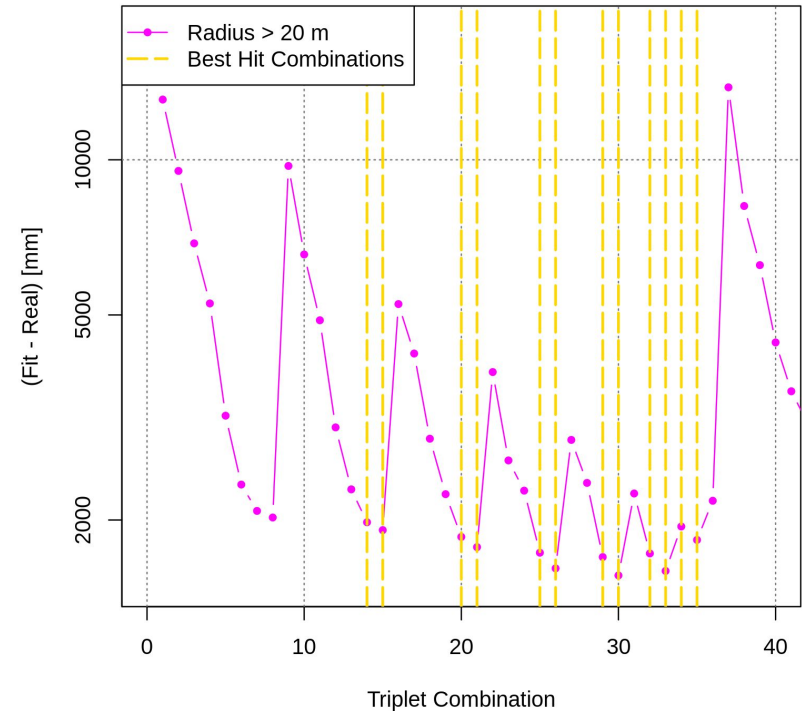


Best Triplet Combinations: Looking Closer (I)

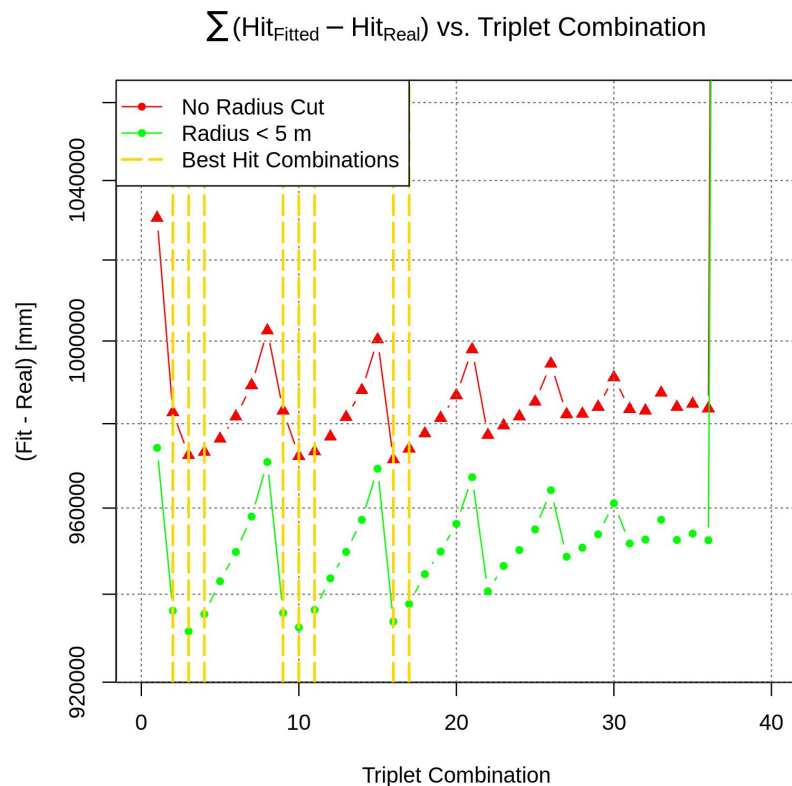
$\sum(\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$ vs. Triplet Combination



$\sum(\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$ vs. Triplet Combination



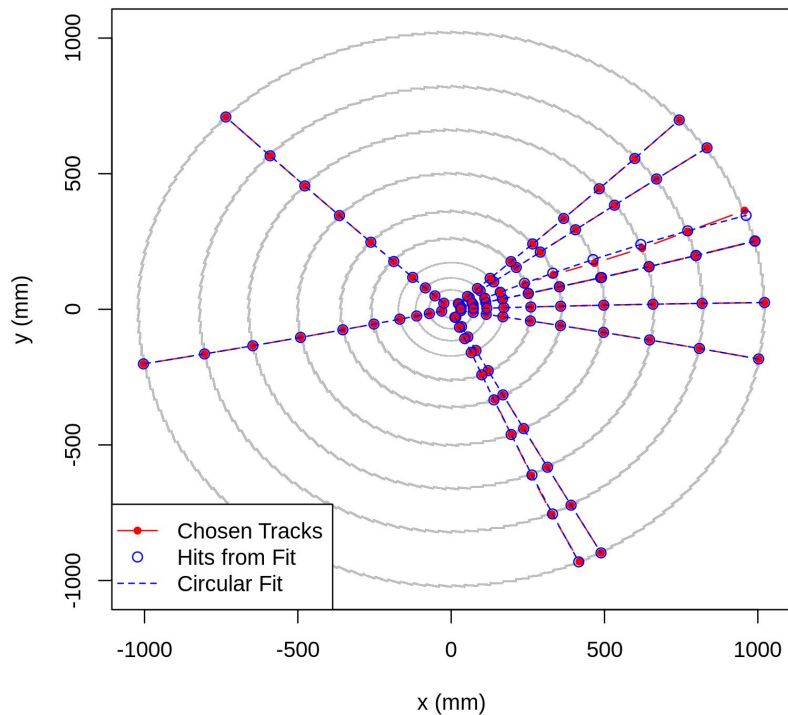
Best Triplet Combination: Looking Closer (II)



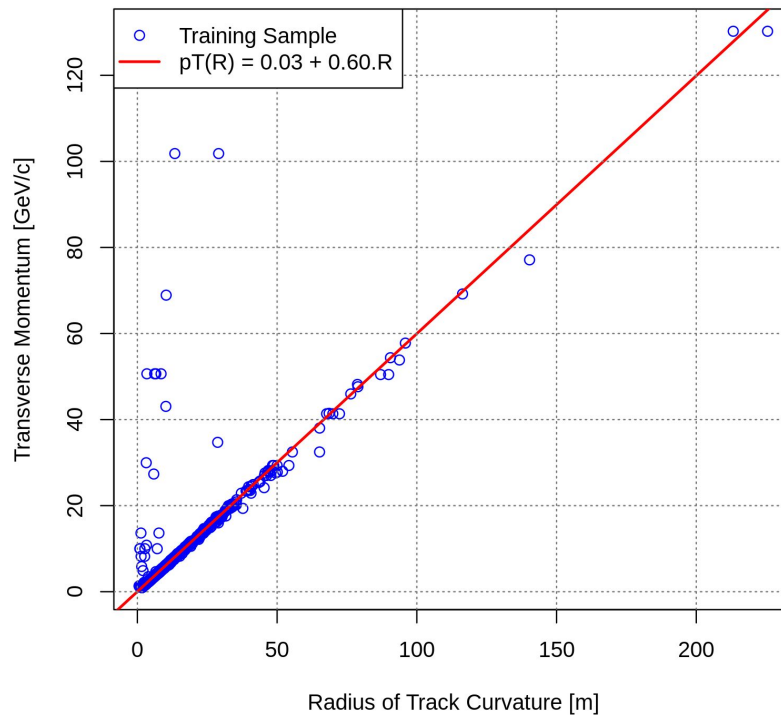
- The idea is to get mean values of (r, x_0, y_0) using the best triplet combinations
- And use them as input for library “circular”

My Solution (I)

Fitting Tracks ($p_T > 10$ GeV/c)

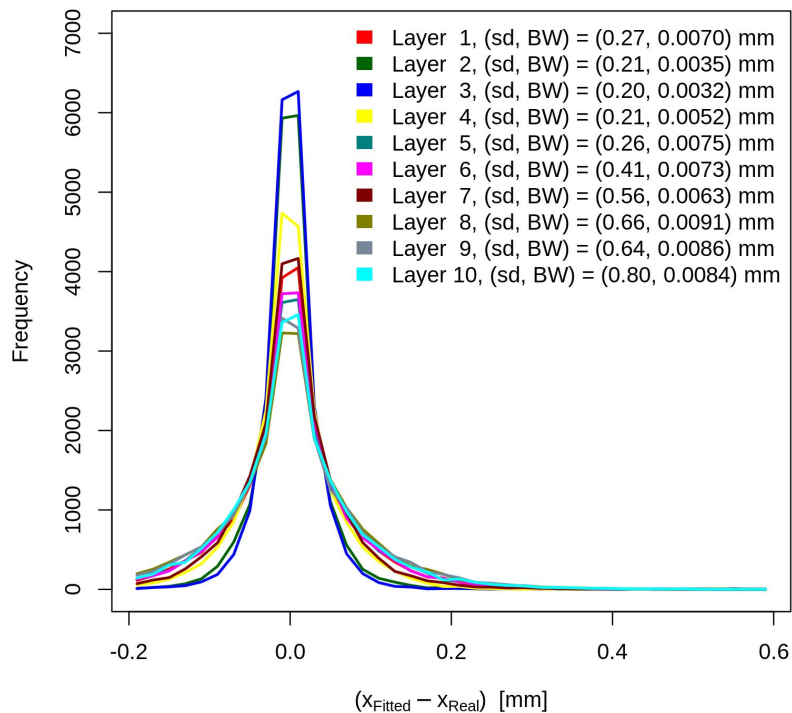


21k Tracks

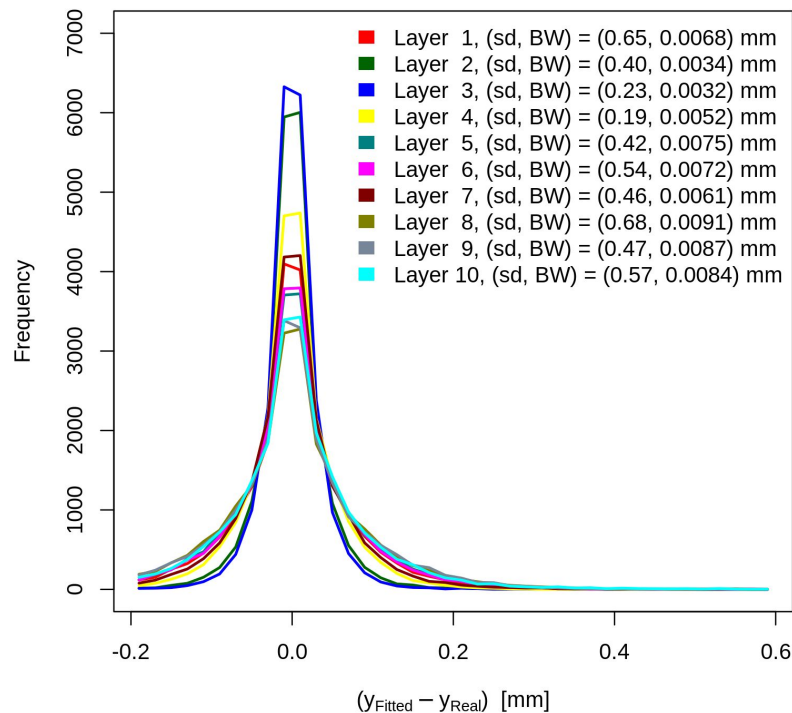


My Solution (II)

21k Tracks

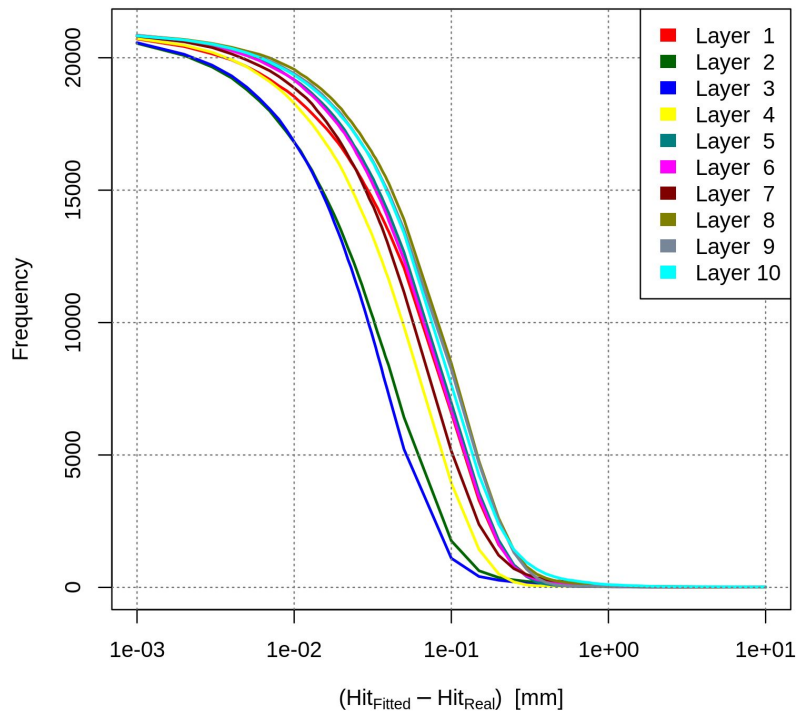


21k Tracks

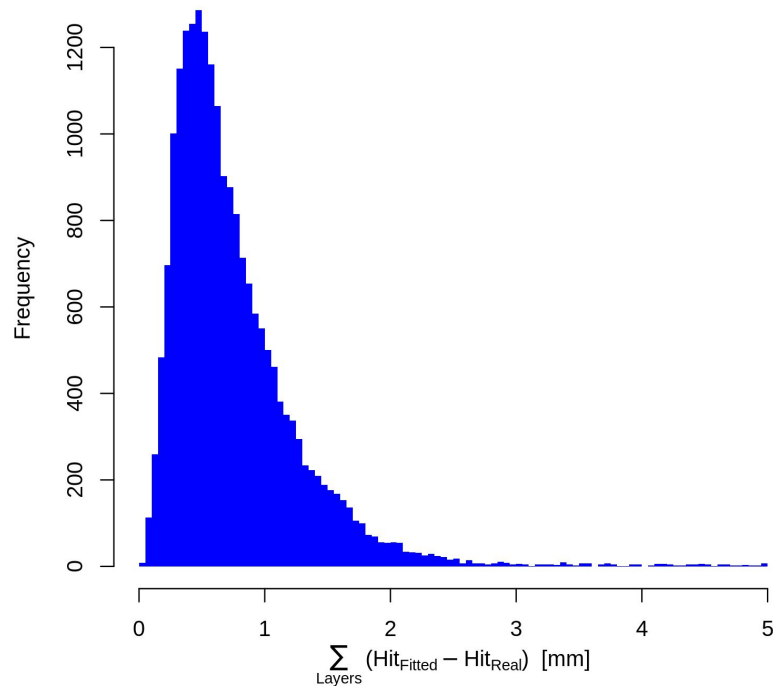


My Solution (III)

Number of Fits Out of Difference ($\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}$)

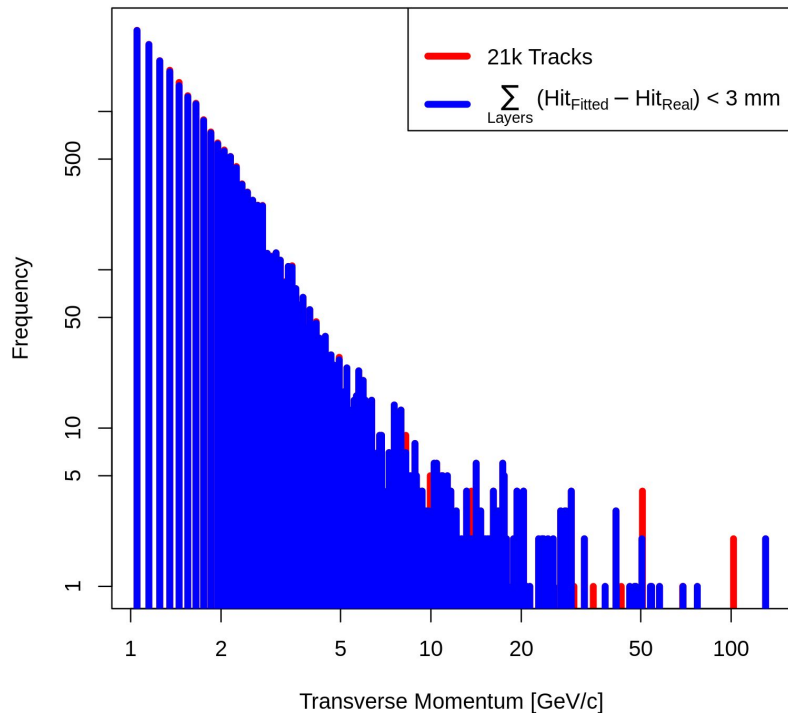


21k Tracks

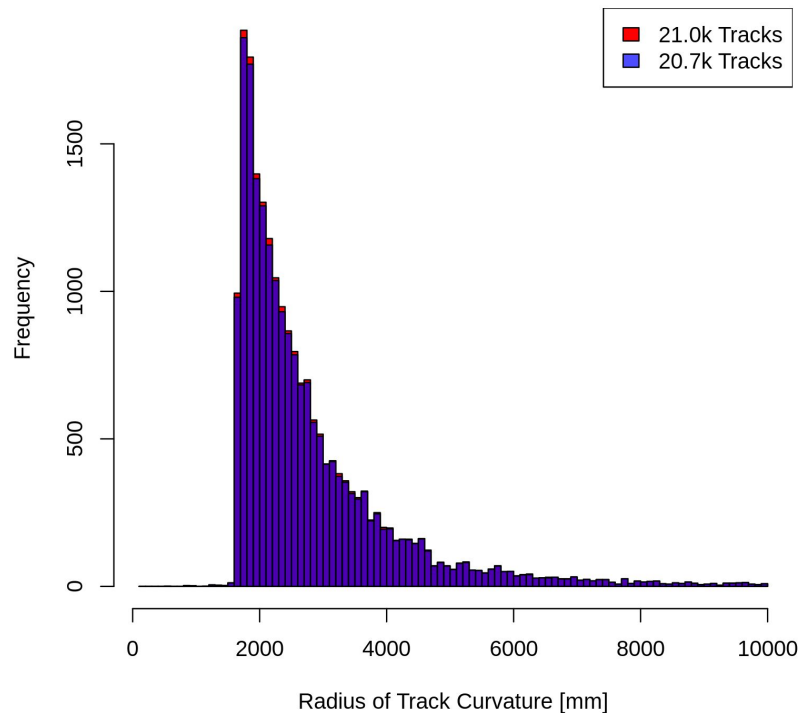


My Solution (IV)

Before and After Cut in $\sum_{\text{Layers}} (\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}})$

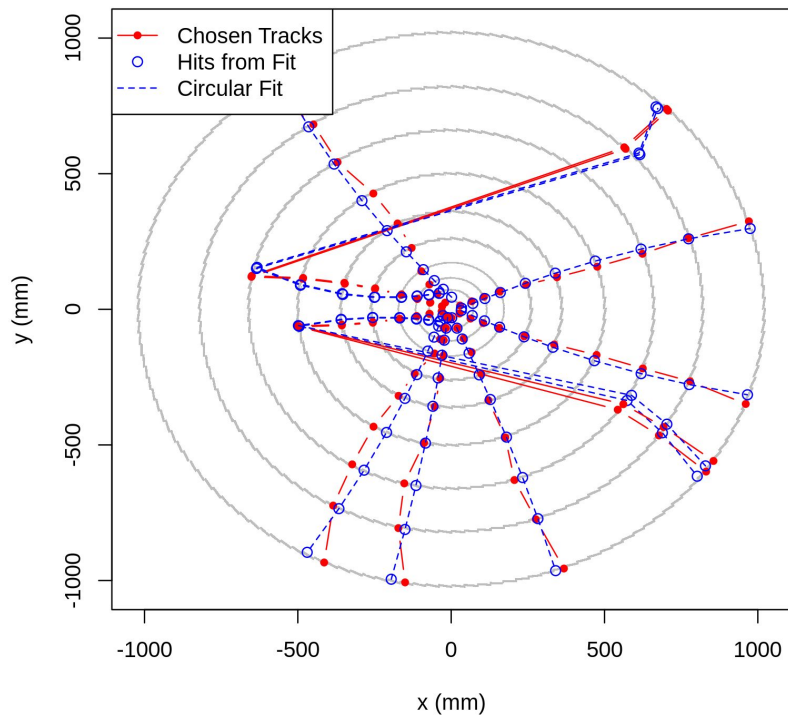


Before and After Cut in $\sum_{\text{Layers}} (\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}) < 3 \text{ mm}$

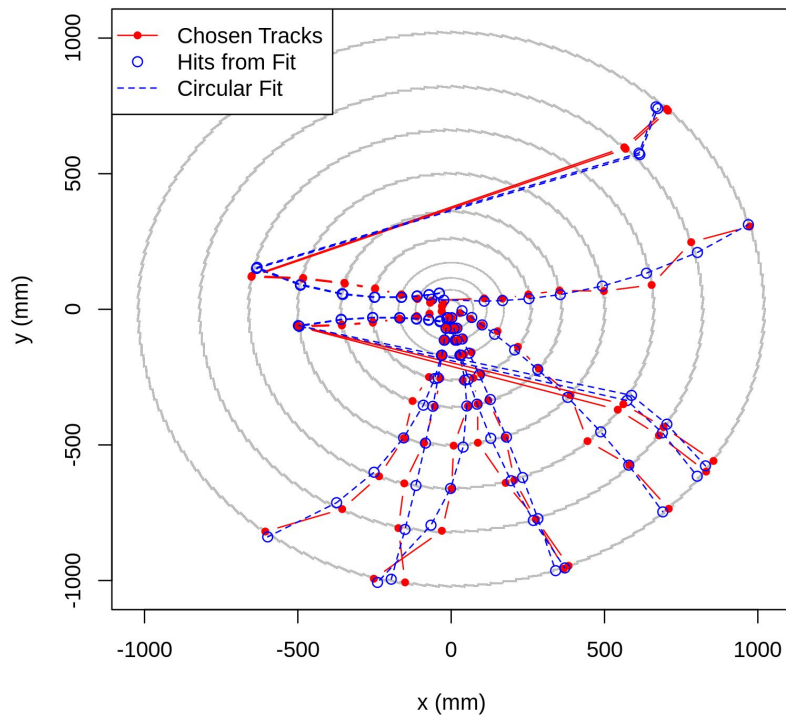


My Solution (V)

Fitting Tracks with $(\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}) > 30 \text{ mm}$



Fitting Tracks with $(\text{Hit}_{\text{Fitted}} - \text{Hit}_{\text{Real}}) > 30 \text{ mm}$



To-Do List

- Use Optimization sample (3k tracks) to validate the fit
- Compare p_T values between
 - values from dataset and values from fits on the reconstructed tracks