



MarlinTPC LikelihoodFitting

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A horizontal dotted line in a light yellow-green color, identical to the one at the top, runs across the bottom of the slide.



HitFinding/TrackSeeder

- **HitFinderTopo**
 - **Finds hits and combines them into tracks**
 - **Martin gave a good description of how it works**
- **TrackSeeder**
 - **Calculates the track parameters of the track candidates**
 - **Does an analytic least-squares fit to the hit positions**
 - **Assumes that “almost-straight” tracks are straight**

- 3 in trunk:
 - **SimpleChiSquared**
 - **SimpleMinimizer**
 - **LikelihoodFitting**
- Likelihood fitter
 - **Works... sometimes?**
 - Rectangular pad layouts work
 - Circular ones don't work unless the tolerance is very high
 - Very sensitive to the drift diffusion used
 - **Very big, needs to be broken up based on**
 - Layout type, whether b-field corrections are used
 - Want it to find the photoelectric calibration data too



Likelihood Overview

- Developed by D. Karlen at Uvic
 - **He implemented it in Java**
- Likelihood(track parameters | data) ==
Pr(data | track parameters)
- So...
 - **Calculate the probability of observing the distribution of charge given the hypothetical track parameters**
 - **Use Minuit to minimize the neg, log. likelihood**



The Charge Distribution Model

- (Homogeneous case first)
- The primary track is nicely projected onto the readout electronics
- Charge is distributed by convolving an isometric gaussian with the track
 - “**line gaussian**”
- Assumes that:
 - **The pads within a row are roughly rectangular**
 - And the row is not curved
 - **The track is straight within a row**



Charge Distribution Model

- (Non-homogeneous model)
- A bit more work:
 - **Use the track parameters to follow the track in the TPC volume**
 - **At specified intervals (25mm default)**
 - Create an electron cloud
 - Drift the cloud to the endplate using the simulation code
 - **Fit a curve to the projected track**
 - Using a spline from GSL
 - **This distorted curve is the “line-gaussian”**
 - **Same assumptions as before**
 - Things are roughly straight in a pad row



Calculate Expected Distribution

- Integrate the “line gaussian” over required pads
- For each row
 - **Sum the total expected electrons**
 - **Calculate the probability of each pad collecting one of those electrons**
- Use the multinomial distribution to calculate the probability of the **observed** charge occurring

- $L(\text{row}) == \text{Pr}(\text{row}) = \frac{n!}{x_1! \cdots x_k!} p_1^{x_1} \cdots p_k^{x_k}, \quad \text{when } \sum_{i=1}^k x_i = n$



Calculate the $-\log(L)$

- So $\log L(\text{row}) =$

$$\log\left(\frac{n! p_1^{x_1} \dots p_n^{x_n}}{x_1! \dots x_n!}\right) = \log(p_1)^{x_1} + \dots + \log(p_n)^{x_n} + \log\left(\frac{n!}{x_1! \dots x_n!}\right) = \sum \log(p_i)^{x_i} + \text{constants}$$

- Sum up the row $\log(L)$
- Multiply by -1 at the end
- Give the result to Minuit which calculates another set of hypothetical track parameters



What Should Happen?

- Minuit finds the most likely track
- Parameter covariance is calculated

```
Minuit did successfully converge.
# of function calls: 48
minimum function Value: 15796.64848439
minimum edm: 0.001934680482668
minimum internal state vector: LAVector parameters:
  -1.988002027558
  -9.250080219873e-05
  -0.1592620260437
   1.617002074724
  -1.620328234995
  -1.037247782143

minimum internal covariance matrix: LASymMatrix parameters:
 1.9761598e-09  4.7270737e-12  2.0067998e-07  5.8692851e-10  1.3608833e-07  -5.8248745e-08
 4.7270737e-12  1.1347672e-14  4.8766488e-10  1.4088426e-12  3.2781621e-10  -1.3933115e-10
 2.0067998e-07  4.8766488e-10  3.4658532e-05  6.2251465e-08  1.6024574e-05  -5.9106829e-06
 5.8692851e-10  1.4088426e-12  6.2251465e-08  1.1142777e-08  -3.4870546e-06  -1.7251635e-08
 1.3608833e-07  3.2781621e-10  1.6024574e-05  -3.4870546e-06  0.01015075  -3.9787298e-06
 -5.8248745e-08 -1.3933115e-10 -5.9106829e-06 -1.7251635e-08 -3.9787298e-06  1.7791881e-06

# ext. || Name || type || Value || Error +/-
0 || phi || free || -1.988002027558 || 3.143373817044e-05
1 || omega || free || -9.250080219873e-05 || 7.532486829552e-08
2 || d0 || free || -0.1592620260437 || 0.004162843513088
3 || tanLambda || free || 1.617002074724 || 7.46417358234e-05
4 || z0 || free || -1.620328234995 || 0.07124166485602
5 || sigma0 || limited || 0.6949613282769 || 0.002398475487283
```



What Usually Happens...

- Minuit hovers around a minimum, then radically shifts a parameter

```
MINUIT Track Parameters: Phi: -1.9880026rads, Omega:  
Complete negative log likelihood: 15797.6740521745  
MINUIT Track Parameters: Phi: -1.9880026rads, Omega:  
Complete negative log likelihood: 15797.67804575624  
MINUIT Track Parameters: Phi: -1.9880026rads, Omega:  
Complete negative log likelihood: 15797.67687997693  
MINUIT Track Parameters: Phi: -1.9880026rads, Omega:  
Complete negative log likelihood: 15797.67518173619  
MINUIT Track Parameters: Phi: -1.9880026rads, Omega:  
Complete negative log likelihood: 15797.67556912397  
MINUIT Track Parameters: Phi: -1.9880026rads, Omega:  
Complete negative log likelihood: 15797.67515671741  
MINUIT Track Parameters: Phi: 5811.5259rads, Omega:  
Complete negative log likelihood: nan  
] logL is nan! nan
```



What usually happens...

- Or, after trying for a while it just gives up

```
WARNING: Minuit did not converge.  
  
# of function calls: 88  
minimum function Value: 15796.58798173  
minimum edm: 0.8683345852382
```

- Tried a number of solutions
 - **Scaling parameters to same order of magnitude**
 - **Keeping diffusion constant along track**
 - **Changing the parameter uncertainties**



The Future

- Quick fix which works:
- while(! fit(track, tolerance))
 - **Tolerance *= 10**
- Taking all suggestions
 - **If anyone can find the solution then the next time we meet I'll buy the drinks! =)**
- Implement fitting functions/classes for the photo-electric calibration system