



Fermi Gamma-ray Space Telescope

Line Analysis Tutorial

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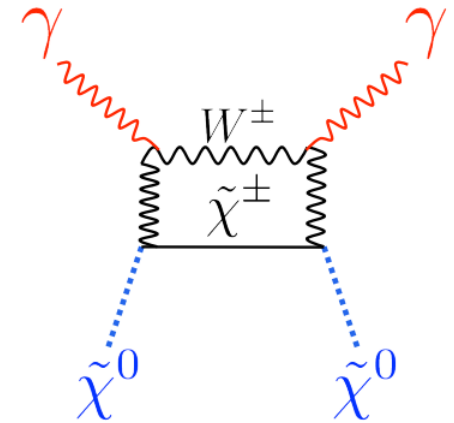
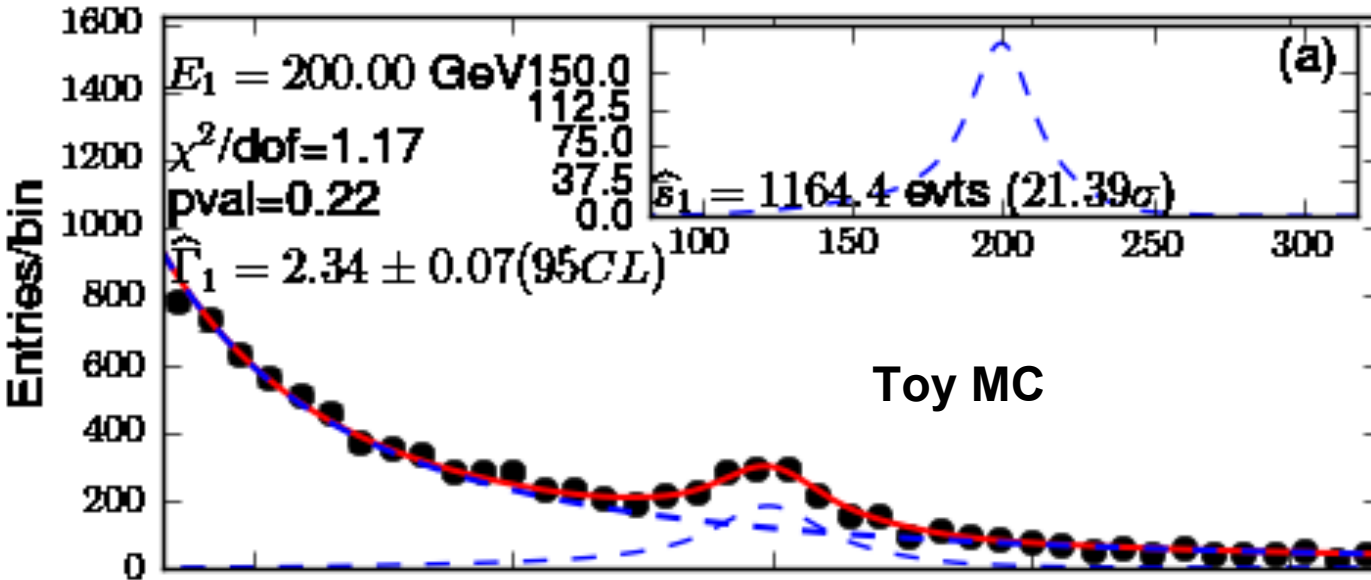


- **ROOT-based code**
 - ROOT is an analysis software used predominantly by particle physicists
 - we are going to use python version pyROOT as well as standard interface
- **Uses “RooFit” package**
 - for likelihood analyses
 - easy to create model PDFs and package does lots behind the scenes for you (like making sure the normalizations are correct)
 - let’s you do complicated fits (fancy models) and modular (easy to add new pieces)
 - for simple fits don’t use RooFit...use e.g. SciPy



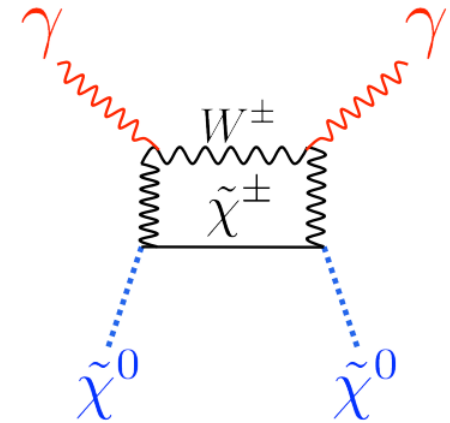
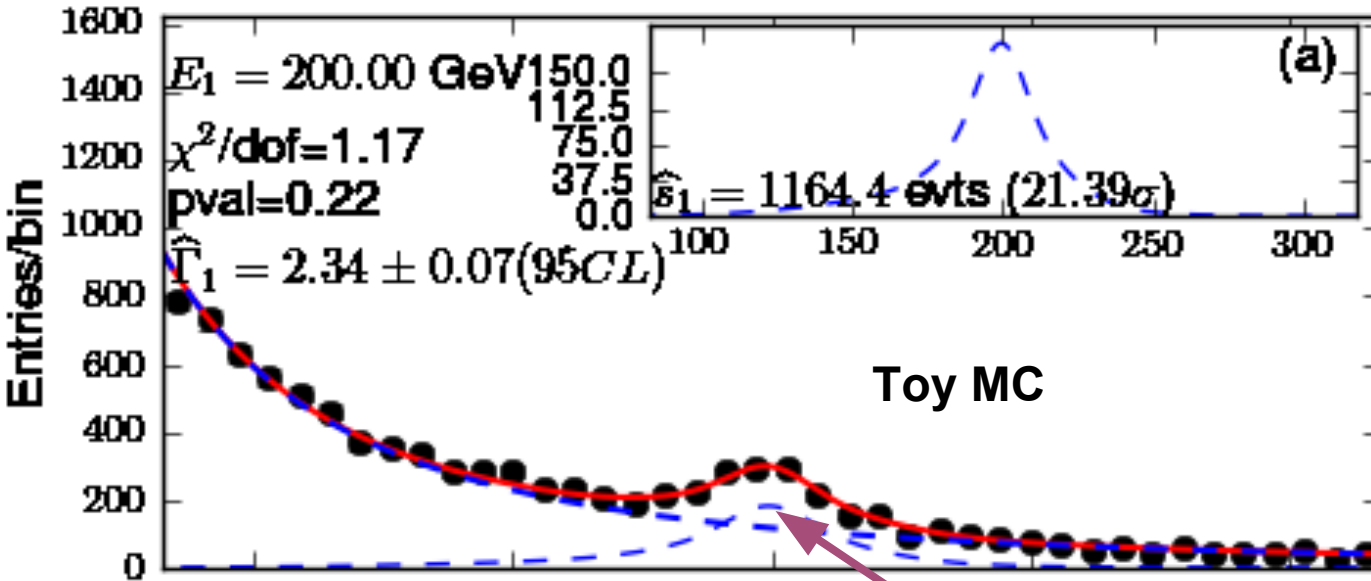
- Merit data (ROOT files) are ROOT Trees
 - you can find some tutorials on ROOT website
 - <https://root.cern.ch/drupal/content/howtos#trees>
 - <https://root.cern.ch/root/html/doc/tutorials/tree/index.html>
- `root -l Vela_22d_100z_base_p7r_clean-select.root`
- `MeritTuple.GetEntries()`
 - total number of events in your dataset
- `MeritTuple.Show(0)`
 - each event in dataset is a different entry...each entry has values defined as “branches”
- `MeritTuple.GetEntries(“CTBBestEnergy>1000”)`
 - find number of events above 1 GeV
- `MeritTuple.Draw(“log10(CTBBestEnergy)”)`
- `MeritTuple.Draw(“FT1B:FT1L”, “”, “COLZ”)`

Search for Gamma-ray Spectral Lines



- Annihilation/decay directly into $X\gamma$ ($X = \gamma, Z^0, H^0$)
 - Location of line in energy spectrum related to m_χ
- Advantage: sharp, distinct feature
 - Looking for a “bump” in the energy spectrum
- Disadvantage: low predicted counts

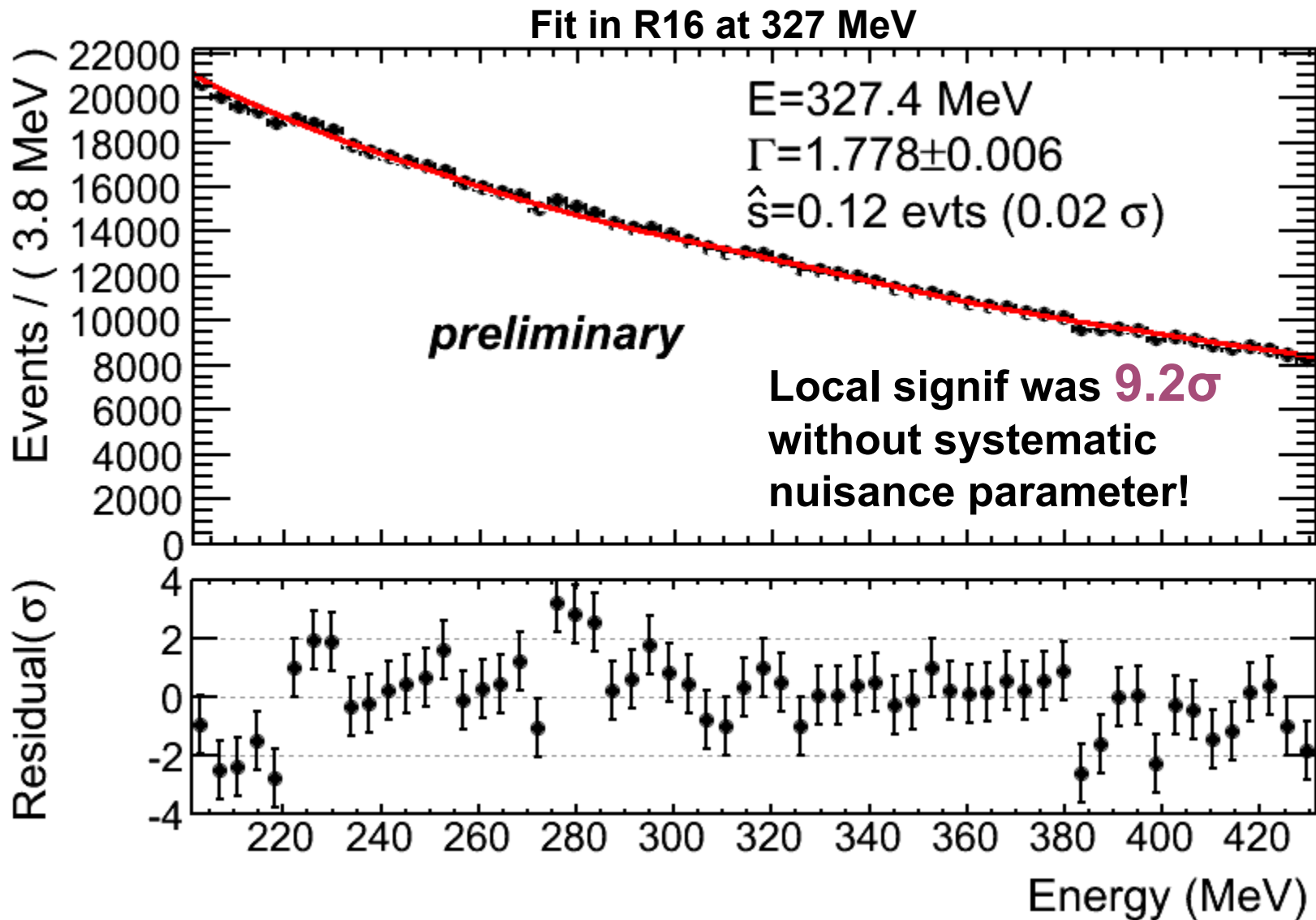
Search for Gamma-ray Spectral Lines



- Annihilation
 - Location: This line is very obvious...but we don't have a bright gamma-ray line in the data
- Advantage: so we need to be careful
 - Looking for a "bump" in the energy spectrum
- Disadvantage: low predicted counts

Cautionary Tale -- Low Energy Line Search

Example Fit – Including n_{sys} is essential!





F_{sig} and F_{bkg} are the
signal and bkg PDFs

$$I_{00} = \sum_i \frac{F_{sig}^2(\vec{x}_i)}{F_{bkg}(\vec{\alpha} | \vec{x}_i)}$$

I_{00} can be interpreted as how much
you can distinguish between the
signal and bkg PDFs.

$$b_{eff} \sim \frac{1}{I_{00} - 1}$$

Larger I_{00} \rightarrow smaller b_{eff}

$$f = \frac{n_{sig}}{b_{eff}}$$

$$signif \approx \frac{n_{sig}}{\sqrt{b_{eff}}}$$

P8 Line Search

Accounting for f_{sys} in Likelihood



- Include nuisance parameter (n_{sys}) for systematically-induced line-like features
 - Only detect a significant line if larger than the line-like features we see in the control regions
 - Introduced method in low-energy line paper (A. Albert et al. JCAP10(2014)023)
 - Similar technique used to incorporate J-factor uncertainties dSph analysis
 - Can be applied whenever accounting for systematic uncertainties is important

$$C(E, \alpha) = \left((n_{sig} + n_{sys}) S(E, E_\gamma) + n_{bkg} B(E, \Gamma_{bkg}) \right) * G_{sys}$$

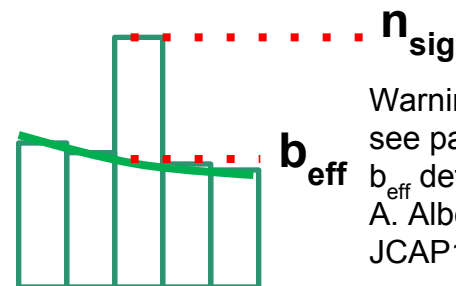
$$\sigma_{sys} = \delta f_{sys} * b_{eff}$$

$$G_{sys} = \frac{1}{\sigma_{sys} \sqrt{2\pi}} e^{-n_{sys}^2 / 2\sigma_{sys}^2}$$

Gaussian constraint on n_{sys}

n_{sys} is constrained using δf_{sys} estimated with control regions

$$f = \frac{n_{sig}}{b_{eff}} \approx \frac{TS}{n_{sig}}$$



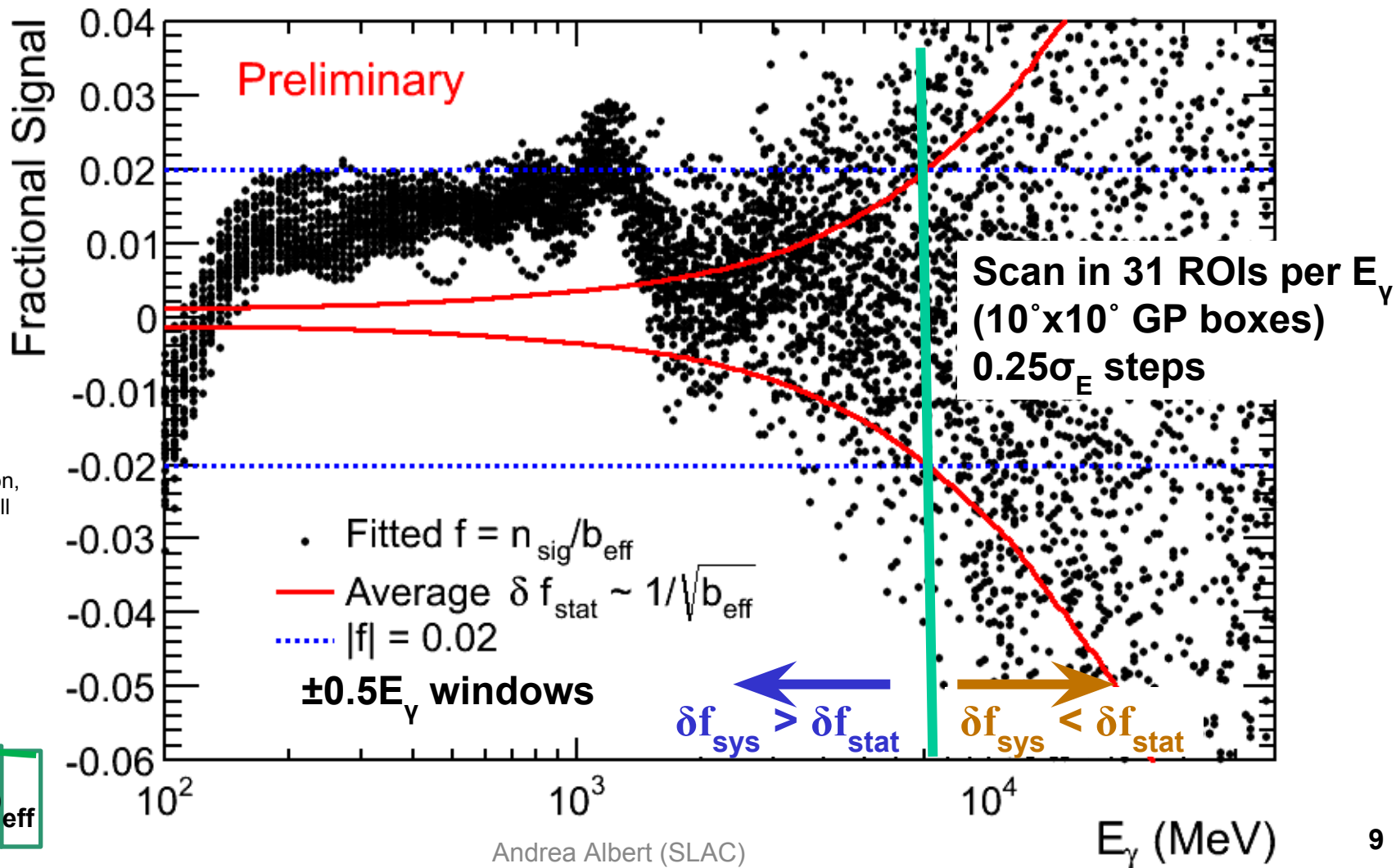
Warning: cartoon, see paper for full b_{eff} definition
A. Albert et al. JCAP10(2014)023

Pass 8 Line Search

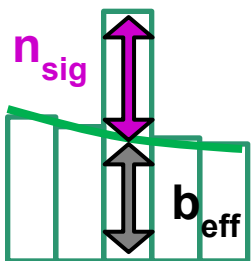
f_{sys} from Galactic Plane Scans



- There are some common features likely from the effective area (A_{eff})
- Displacement from 0 is mostly from A_{eff} , while spread is from bkg. modeling
- Larger systematic effect with wider windows (since power-law approx. gets worse)



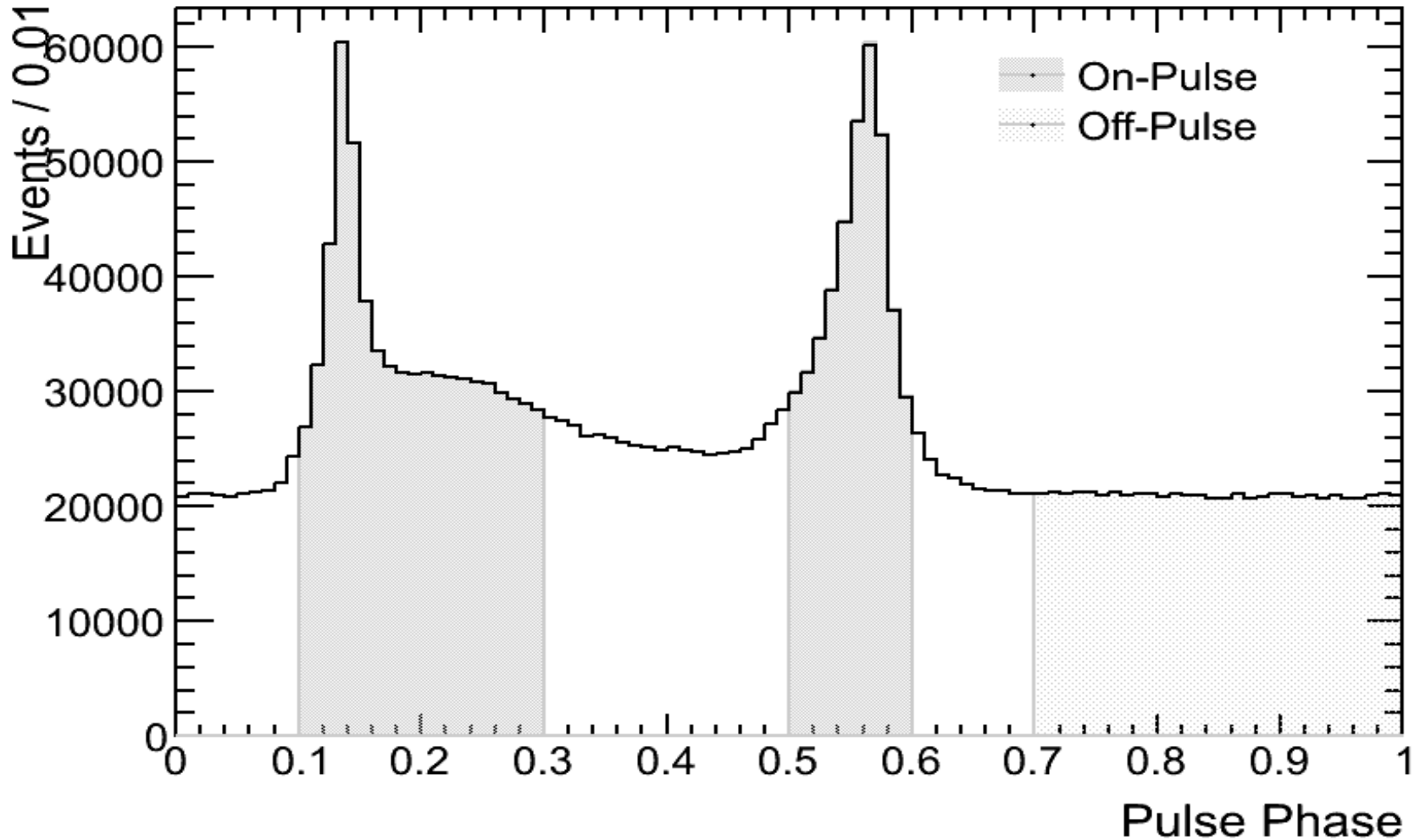
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JCAP10(2014)
023



Vela as a Control Sample

- Can use pulse phase to select pure gamma-ray sample
- Vela is a common control sample for LAT systematic investigations
- Don't expect spectral lines from Vela
 - we see how big the “line” in Vela's spectrum are
- Our dataset:
 - ROI: 22° radius circle centered on Vela
 - Energy Range: 100 MeV – 100 GeV
 - Standard data quality cuts
 - $\theta_r < 52^\circ$
 - $\theta_z < 100^\circ$ for ROI applied w/ *gtmktime*

Definition of Vela Phase Ranges



On-Pulse: [0.1-0.3, 0.5-0.6]

Off-Pulse: [0.7-1.0]



- **Top level is FitVela.py**
- **python FitVela.py -h**
- **python -i FitVela.py -i Vela_22d_100z_base_p7r_clean-select.root -o "test" -f 500. -m 200. -M 800. -S Models/Line_P7REP_CLEAN_V15_1D_Vela.yaml -B Models/Vela.yaml --negative -s 0.02**



- `root -l test_FitResults.root`
- `FIT_RESULTS.Show(0)`
 - What is the significance?
- `FIT_RESULTS_SYST.Show(0)`
 - What is the fractional size of this line?
 - What is the significance?



- Try fitting at 250 MeV, 527 MeV, 1 GeV, 5 GeV, and 9.7 GeV
 - instead of using ‘-f -m -M’ options, call range file
 - -r FitRanges_P7REP_CLEAN_V15_comb_2sig.txt
- Try plotting fractional size vs. Fit Energy
 - `FIT_RESULTS.Draw(“(Signal_Counts)/(Bkg_Effective):Fit_Energy”)`
- Try plotting the statistical uncertainty ($\sqrt{\text{Beff}}$) vs Fit Energy