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# VERITAS Analysis: Concepts and Practices in IACTs

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Jon Dumm

UMD – Fermi, VERITAS, HAWC Workshop

Feb 11, 2014

Credits: Gernot Maier, Ben Zitzer



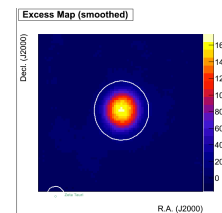
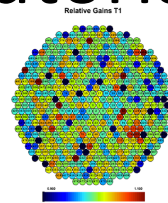
Jon Dumm - Univ. of Minnesota





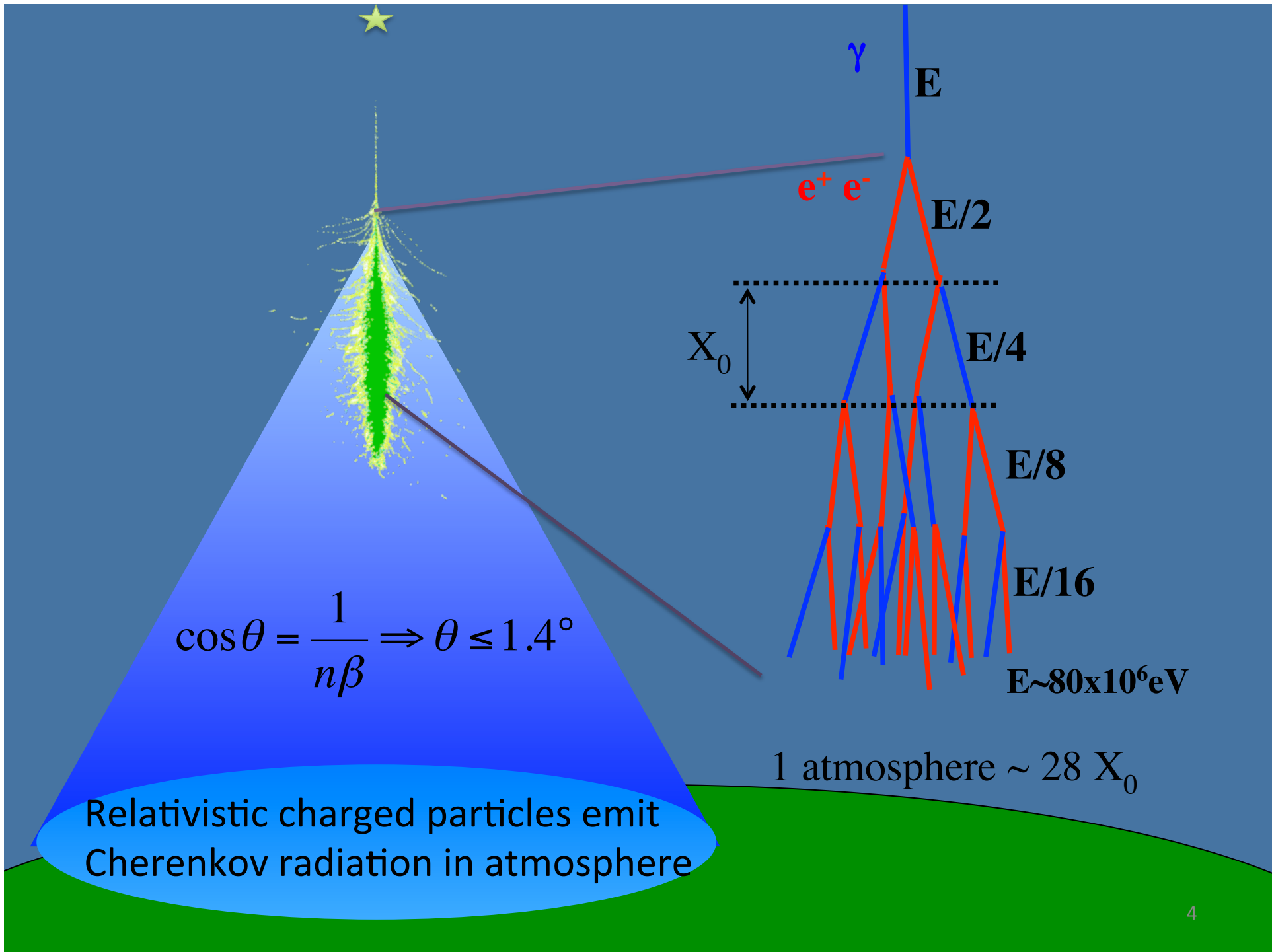
# Goals

- Introduce VERITAS analysis packages
  - Cover concepts of ‘standard’ IACT analysis
- Hands-on analysis tutorials
  - Examining events
  - Creating skymaps

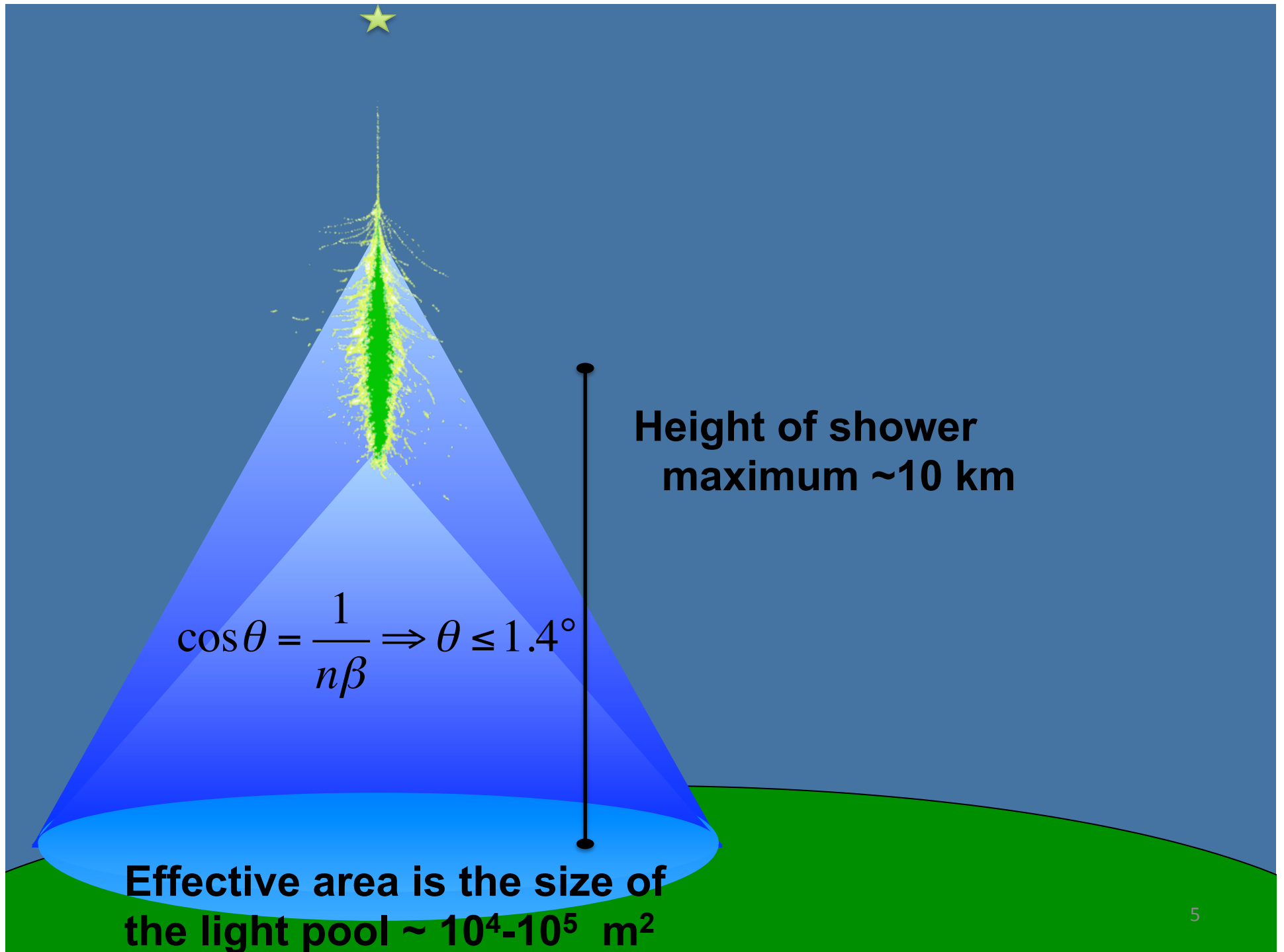


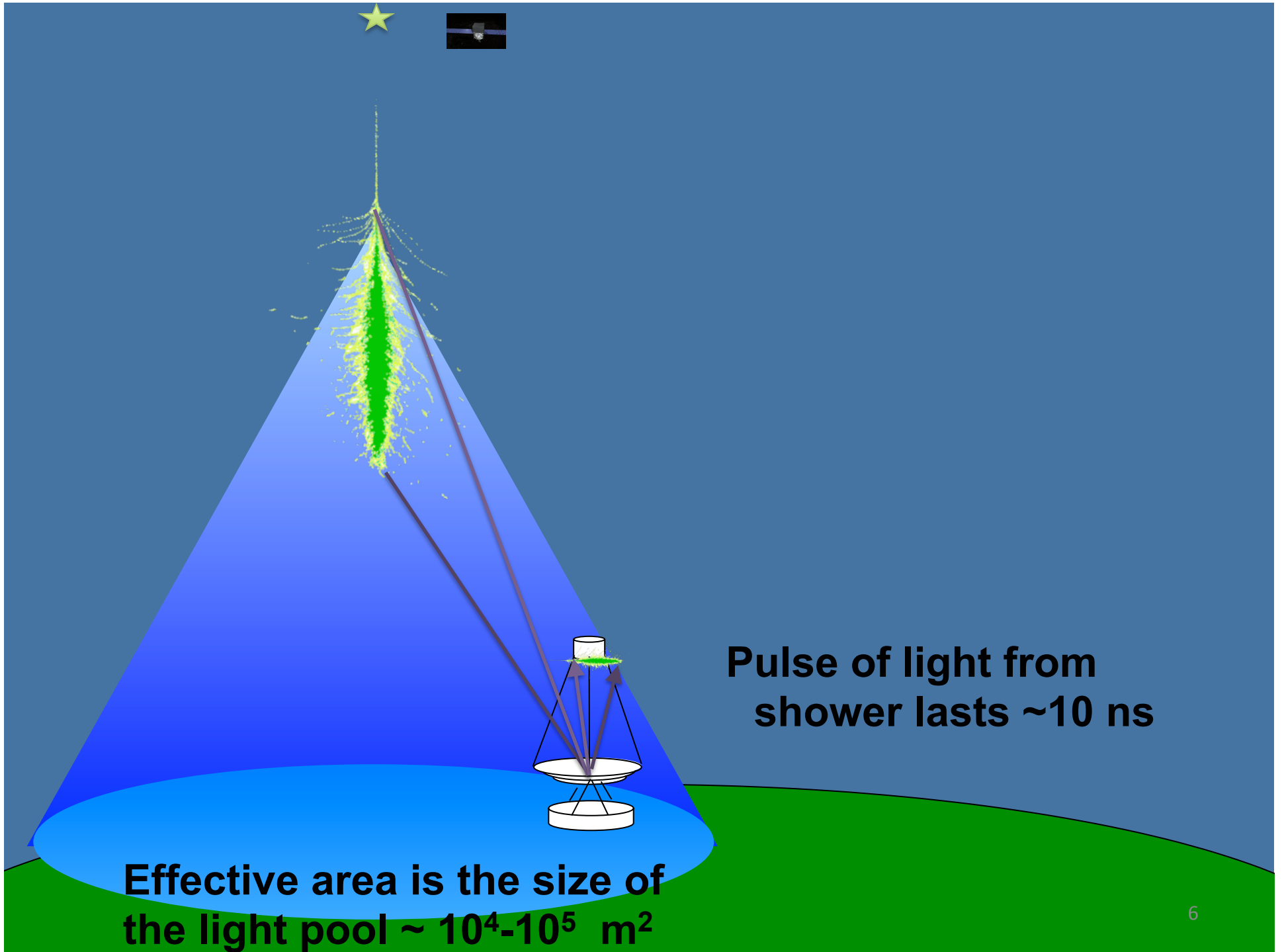
# Basics of IACT Technique











**Pulse of light from shower lasts ~10 ns**

**Effective area is the size of the light pool ~  $10^4$ - $10^5$  m<sup>2</sup>**

# VERITAS Components

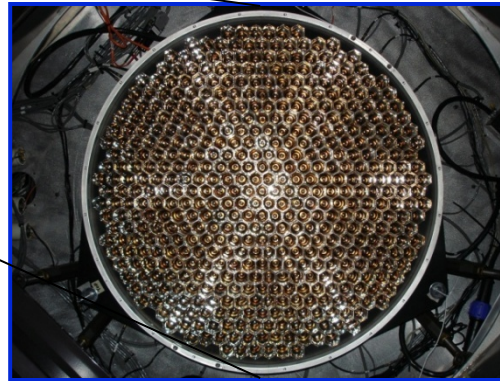


## Telescope (x 4)

12-m diameter Davies-Cotton  
f/1.0, 110 m<sup>2</sup> area



PMT Assembly



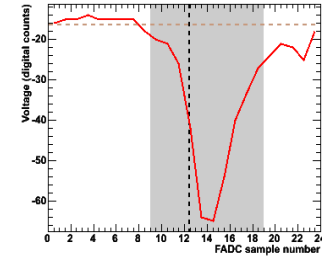
## Camera (x 4)

499 PMTs, 3.5° FOV



## Mirror Facets (x 350 x 4)

Reflectivity ~ 88%  
(Recoated every 2 years)



FADC Board & Trace

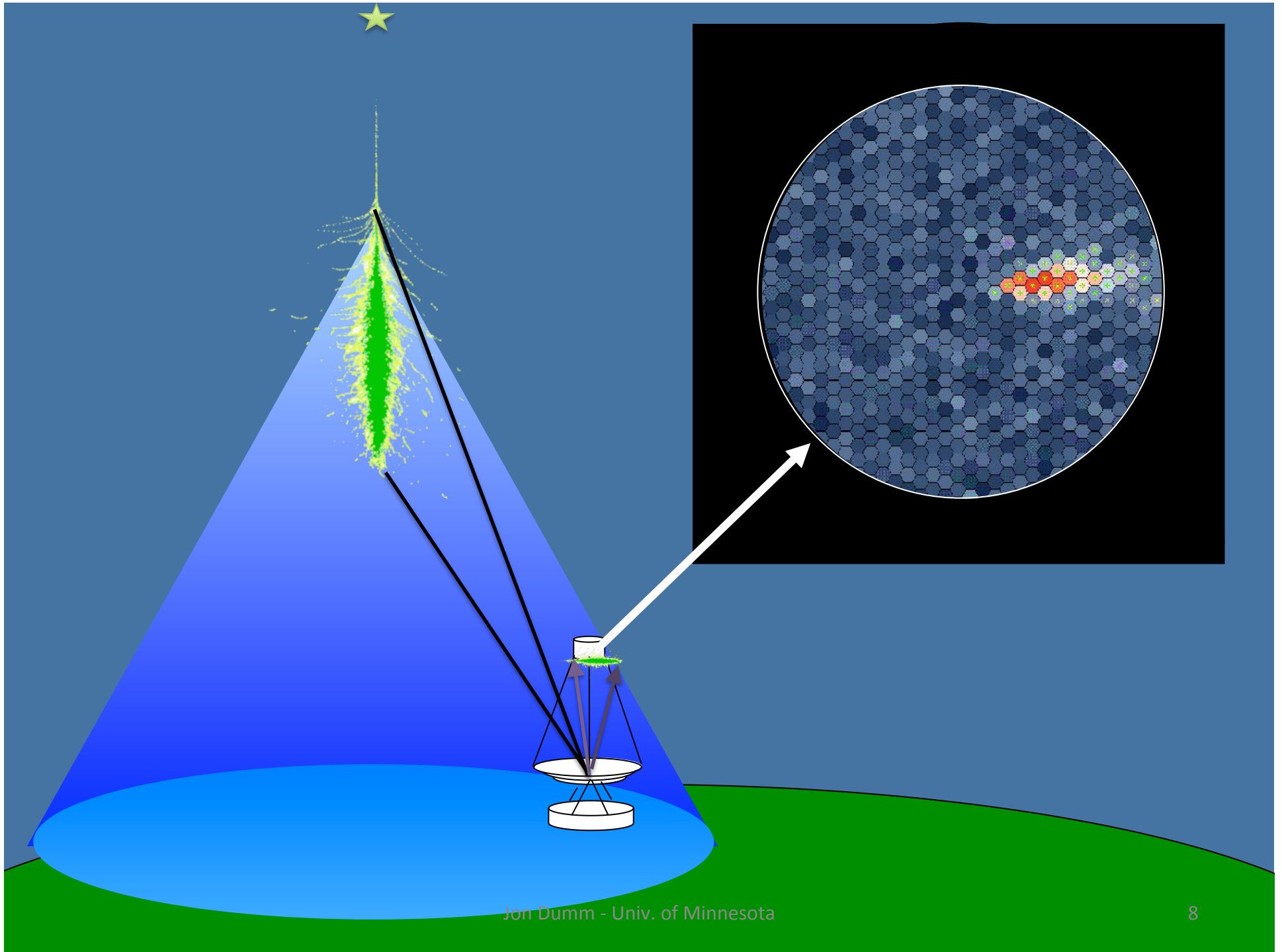


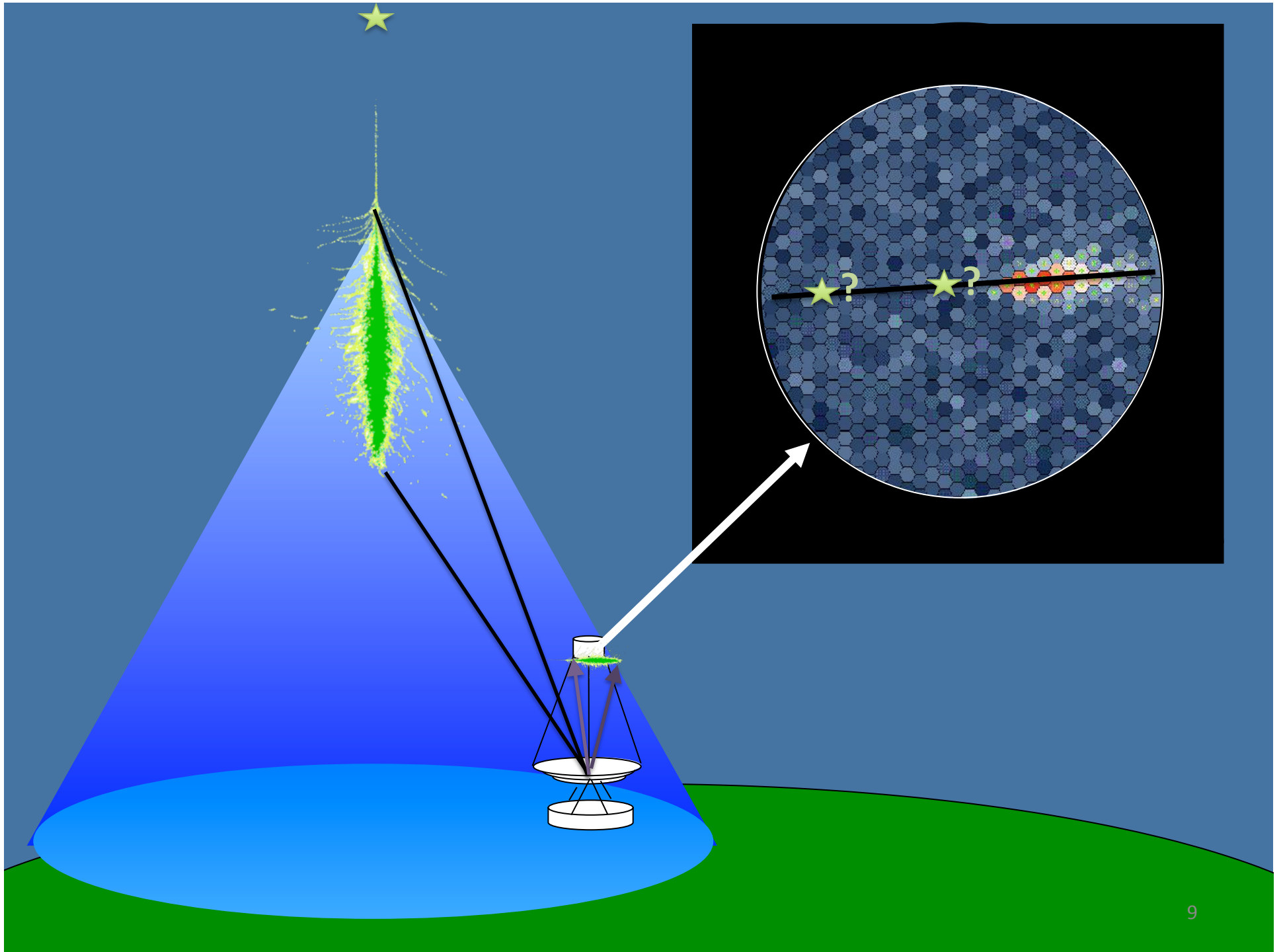
## FADC Readout

500 Mps, dual-gain

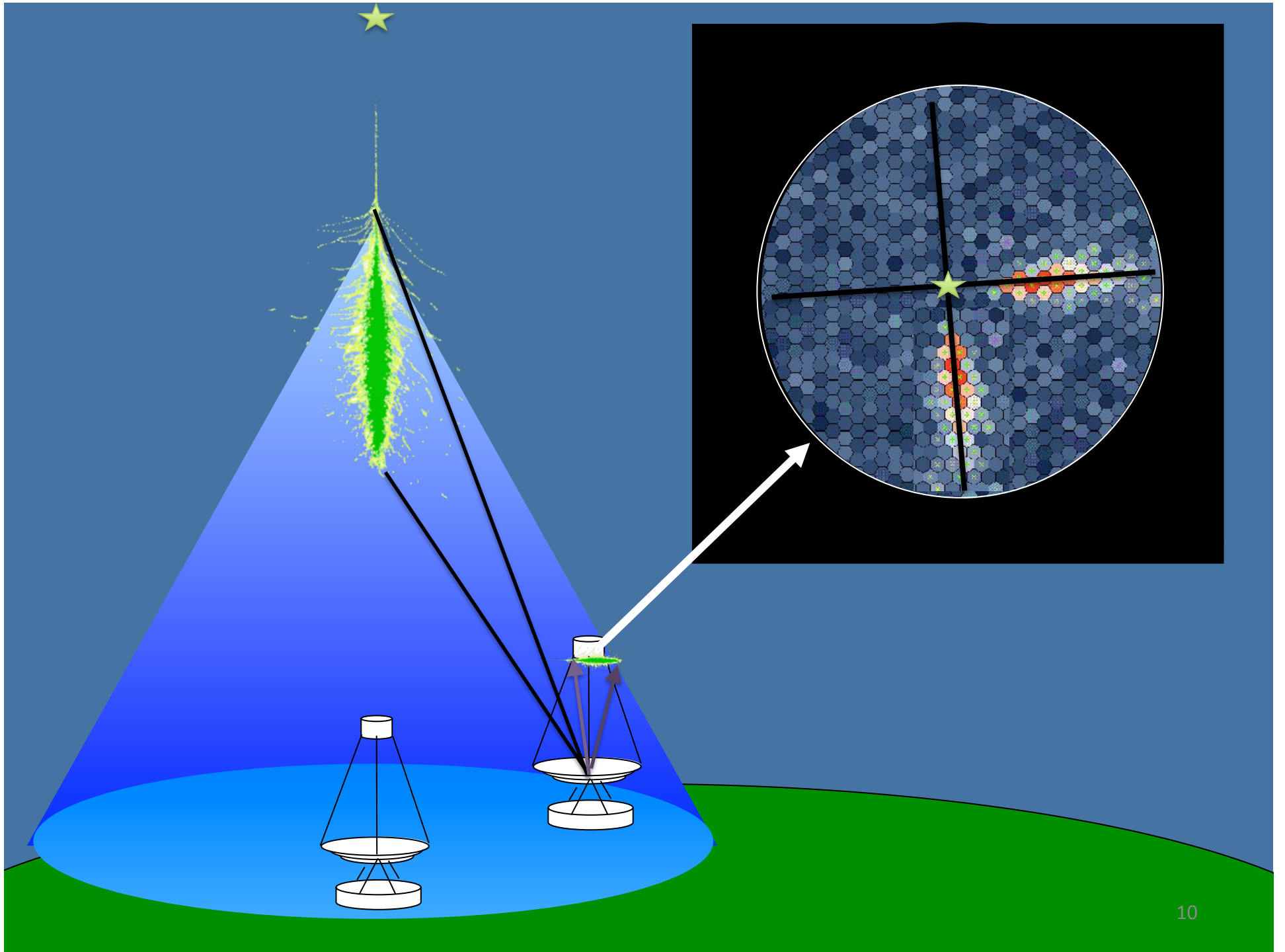
## 3-Level Trigger

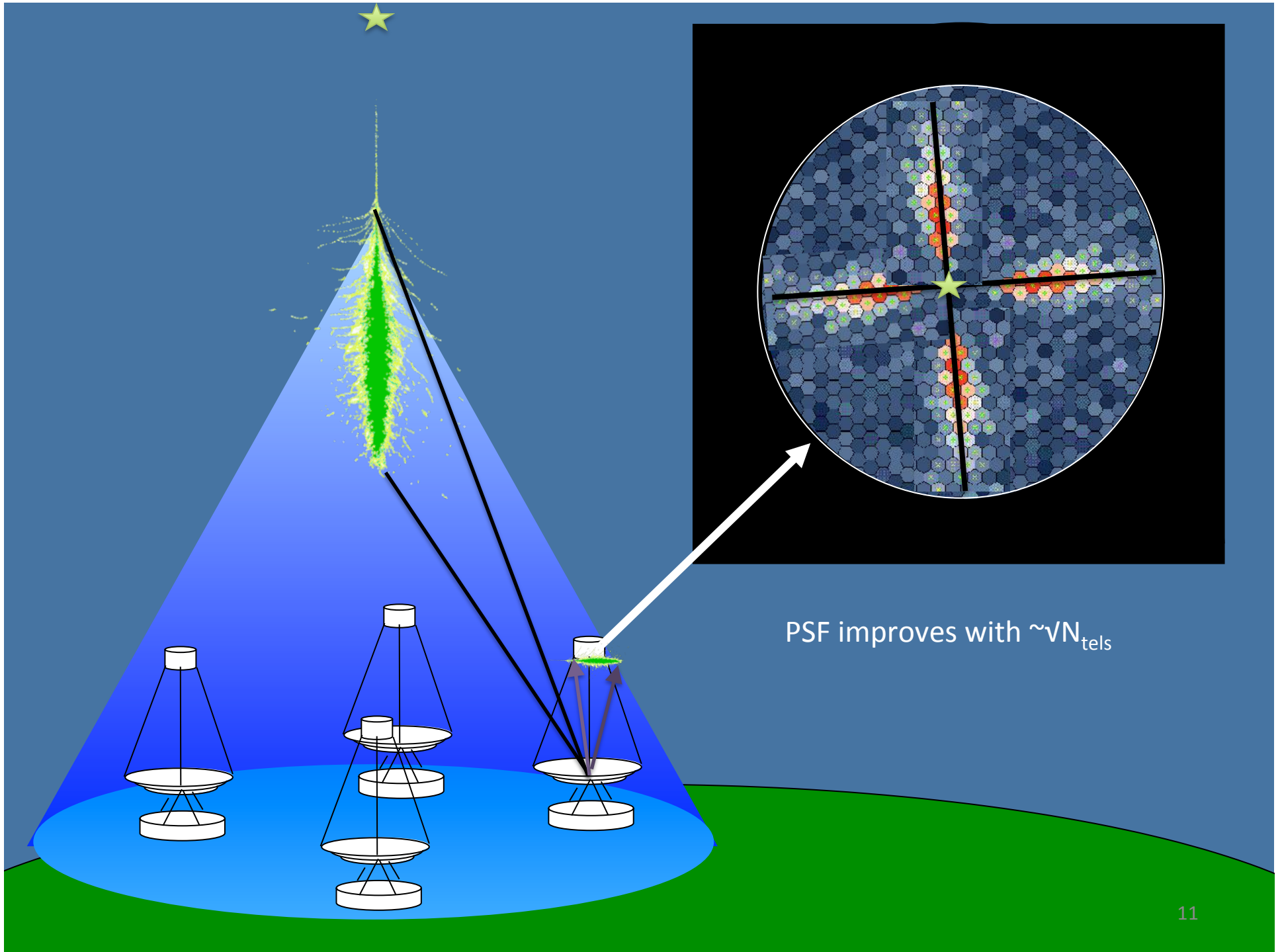
Pixel, Telescope, Array  
Deadtime ~15% @ 400 Hz







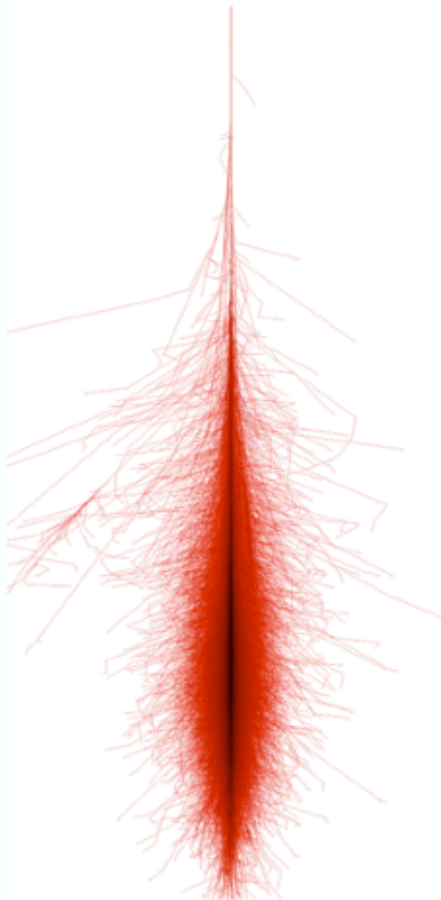




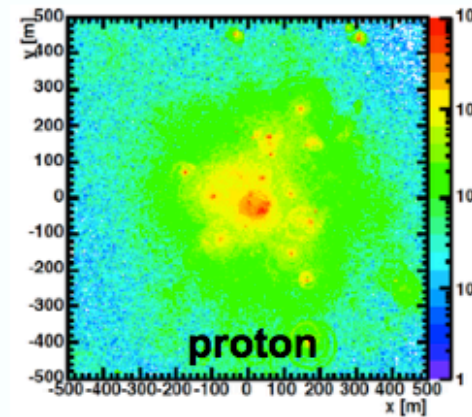
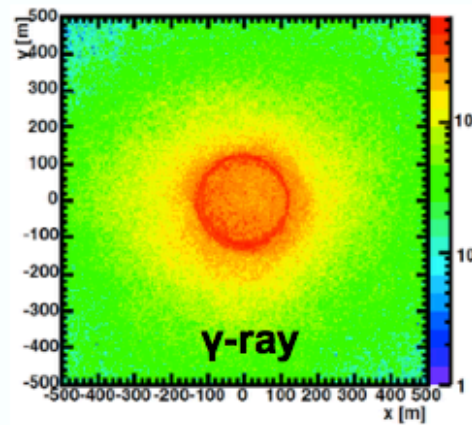


# Simulated Showers

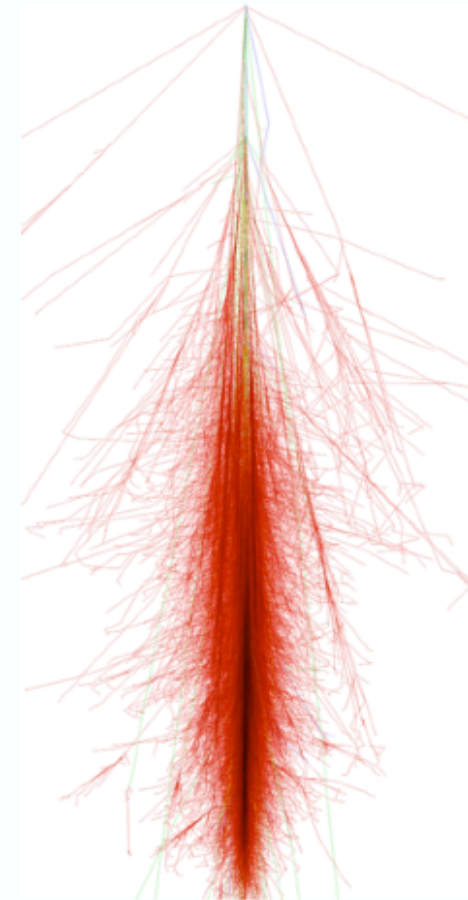
$\gamma$ -ray



Cherenkov photons on ground

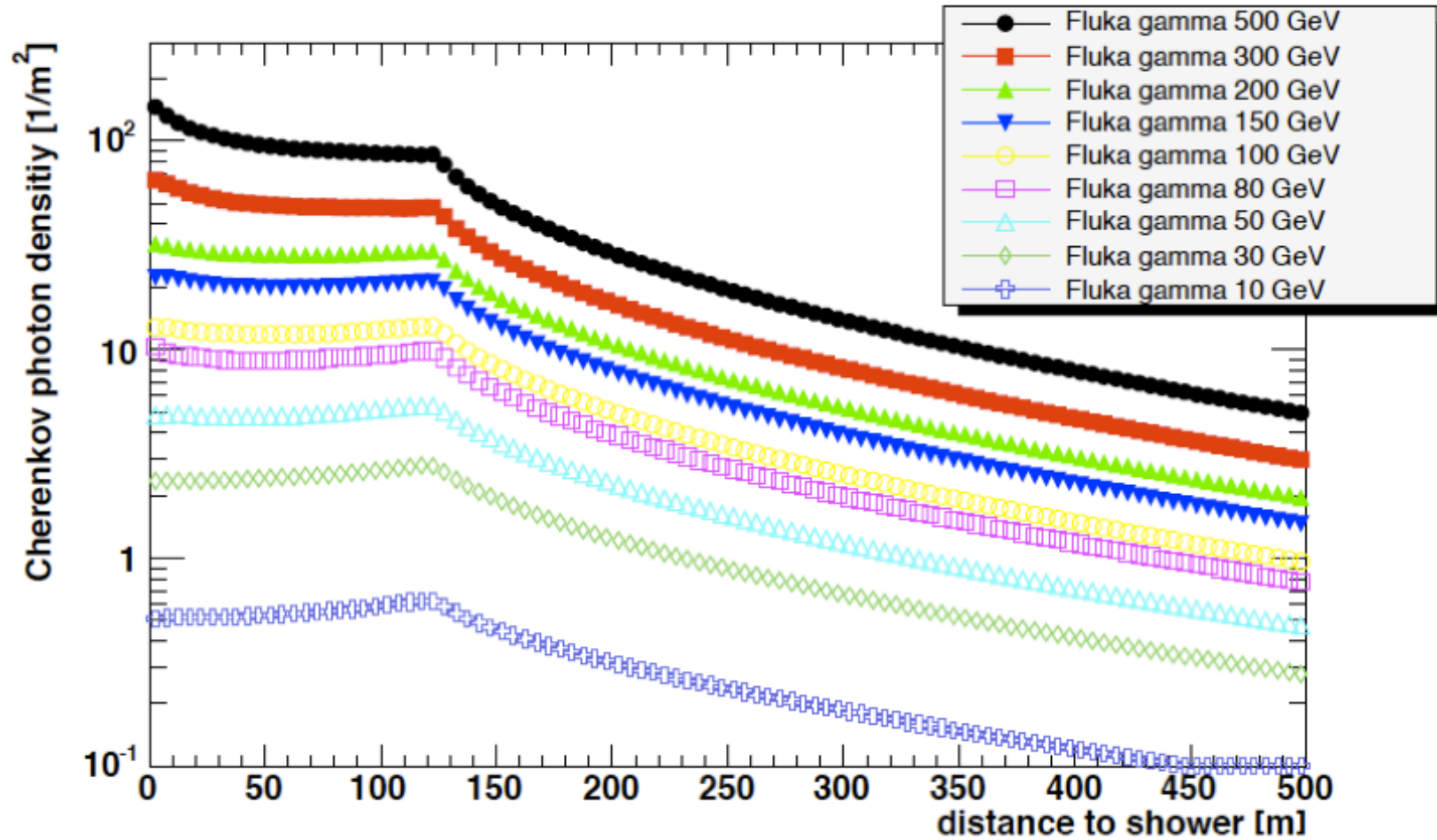


proton





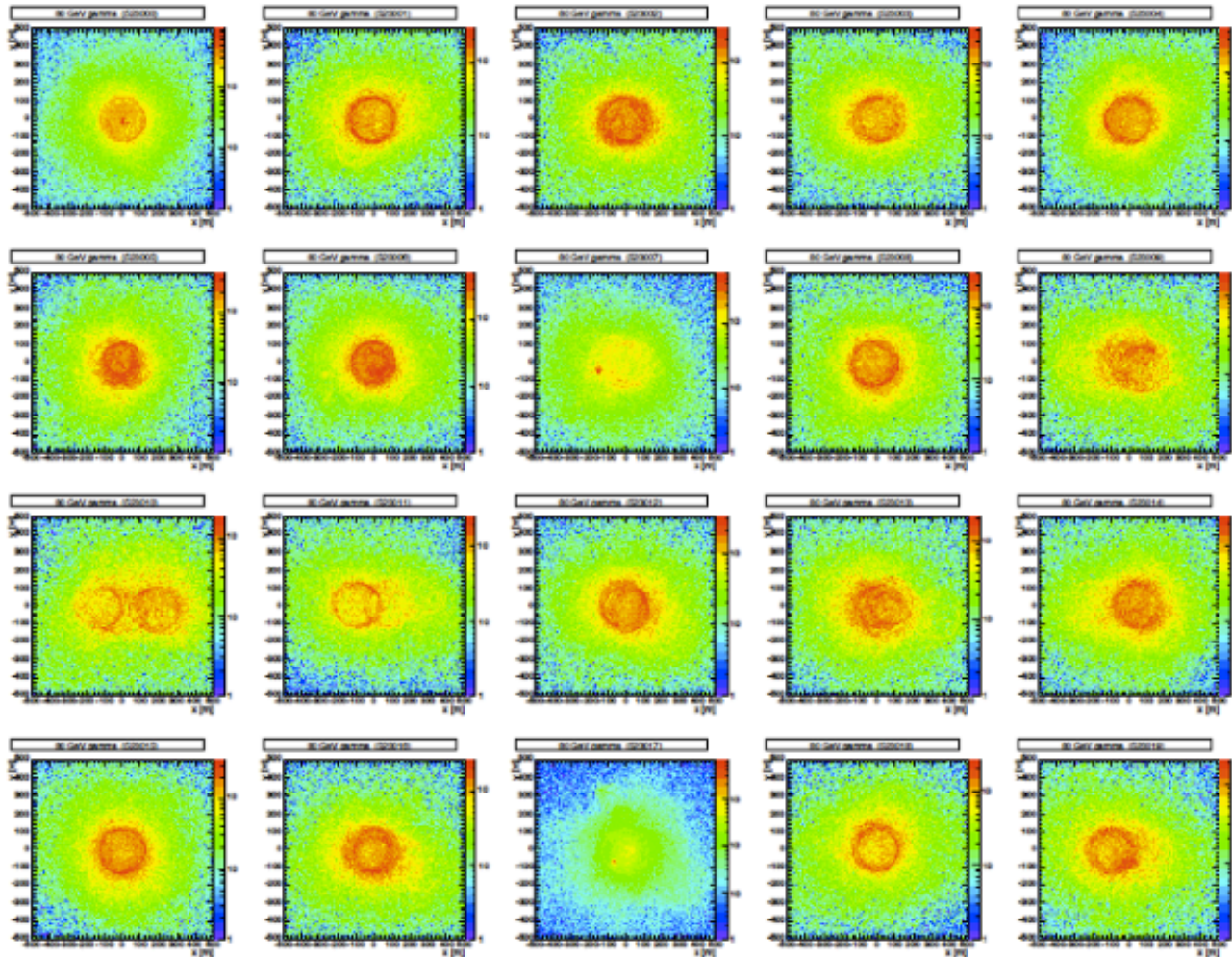
# Simulated Showers





# Simulated Showers

randomly selected showers with 80 GeV primary photon energy



# Offline Analysis Packages



- Two parallel analysis packages
  - **VEGAS** – VERITAS Gamma-ray Analysis Suite
  - **ED** – eventdisplay (Gernot Maier)
    - (but it does more than the name suggests, includes CTA)

- Independent development over ~8 year period

Revision **1.1** - ([view](#)) ([download](#)) ([annotate](#)) - [[select for diffs](#)]  
*Tue Jul 12 14:19:08 2005 UTC (8 years, 6 months ago) by pcogan*  
Branch: [MAIN](#)

Added some new files

- All published results duplicated in independent secondary analyses

# Design Philosophy

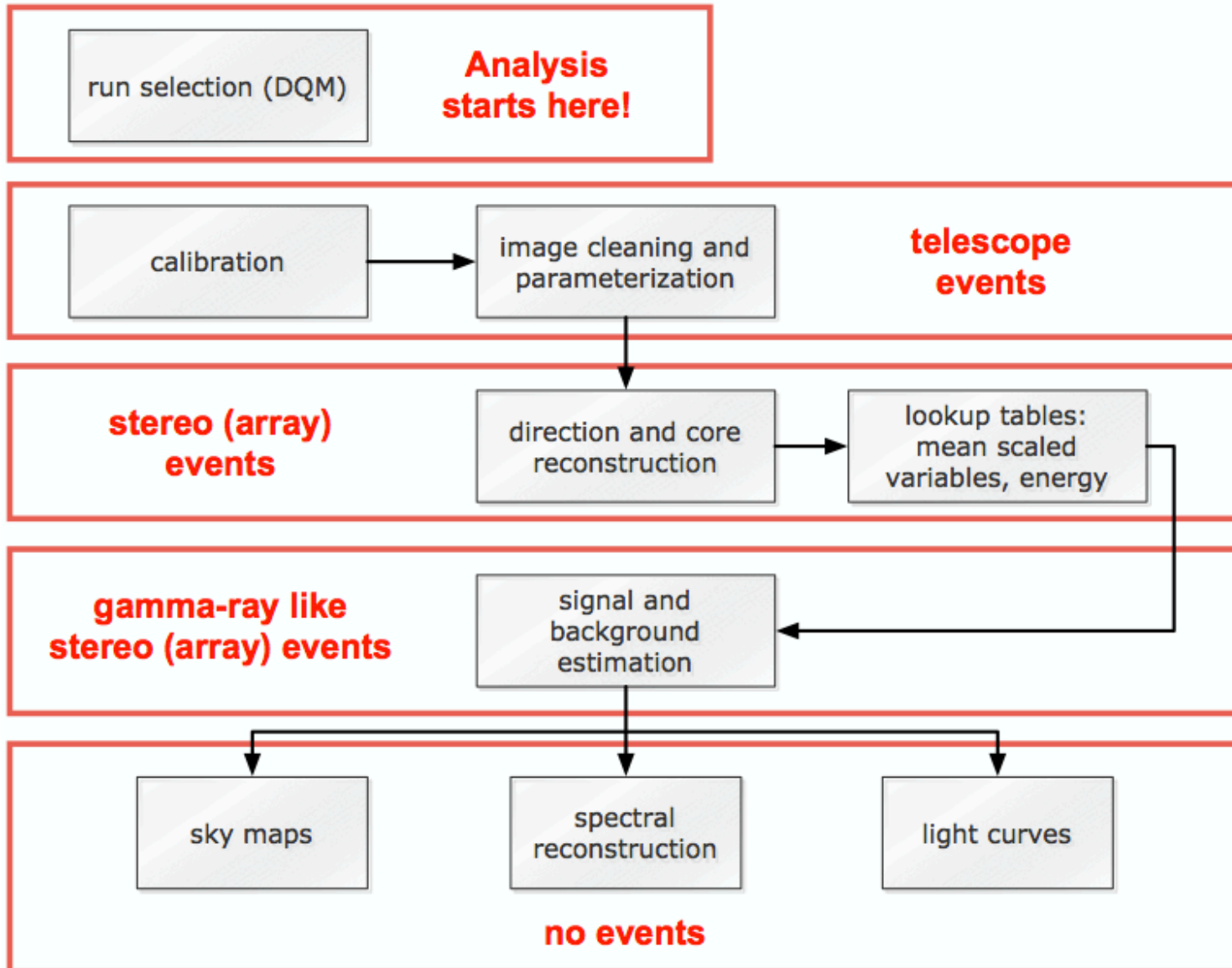
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- Both written in C++, heavily dependent on ROOT
- Modular: processing in stages
- Flexible
  - Lots of options, alternative algorithms
  - File format is quite rigid, however
- Most point-source analysis standardized
  - Automated analyses can be trusted ~90% of the time
  - More about non-point source analysis tomorrow



# Analysis Overview





# Analysis Overview

run selection (DQM)

**Analysis starts here!**

calibration

image cleaning and parameterization

**telescope events**

**stereo (array) events**

direction and core reconstruction

lookup tables:  
mean scaled variables, energy

**gamma-ray like stereo (array) events**

signal and background estimation

sky maps

spectral reconstruction

light curves

**no events**





# Log Sheet Generator

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## VERITAS Run Log Generator

The [LogGen page on GammaWiki](#) includes a User Manual.

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### Nightly ELog (Date Search)

Choose Today (UT) or select a date and click Submit :

Today Year: 2014 ▾ Month: February ▾ Day: 01 ▾ Submit Reset

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### Run Search

Specify run id to bring up log entry :

Run ID :  Search Reset

---

~1000 hours of dark time/year to sift through  
~+300 hours of moon time w/ increased threshold  
(10-15% duty cycle)

# Targeted Search



Specify search criteria and click 'Search'.

## Source name options :

- Start typing and press <right-arrow> to complete a name from the list or click to select.
  - List of sources updates automatically on page reload.
  - (688 sources have successful data runs; list is up-to-date.)
- **New!** Use the 'as prefix' checkbox to list, for example, all GRB data in one search.
- Use source name wildcard 'any' to find any type of run at all.
- **New!** More search wildcards for calibration/engineering data: check the drop-down list.
- [Click here](#) for Andrew McCann's tool to build run lists based on telescope pointings.

Source Name :  (as prefix ) OR select from this list:

Observing Mode :

Begin Date : Year:  Month:  Day:

End Date : Year:  Month:  Day:

Weather :  ≥A  
 ≥B  
 ≥C  
 All/any weather conditions

Elevation : Lower:  Upper:

Required Telescopes :  T1 AND  T2 AND  T3 AND  T4

Data Category :  Regular AND  Filter AND  Reduced HV

Number of telescopes : at least  at most

Online Status :

Offline Status :

Offline Status Reason :

Offline Data Category :

Usable duration (mins) : at least

Offline Light-level :

Interfaces with DB to generate a run list – essentially a MySQL query wrapper around user search criteria





# Log Sheet Generator

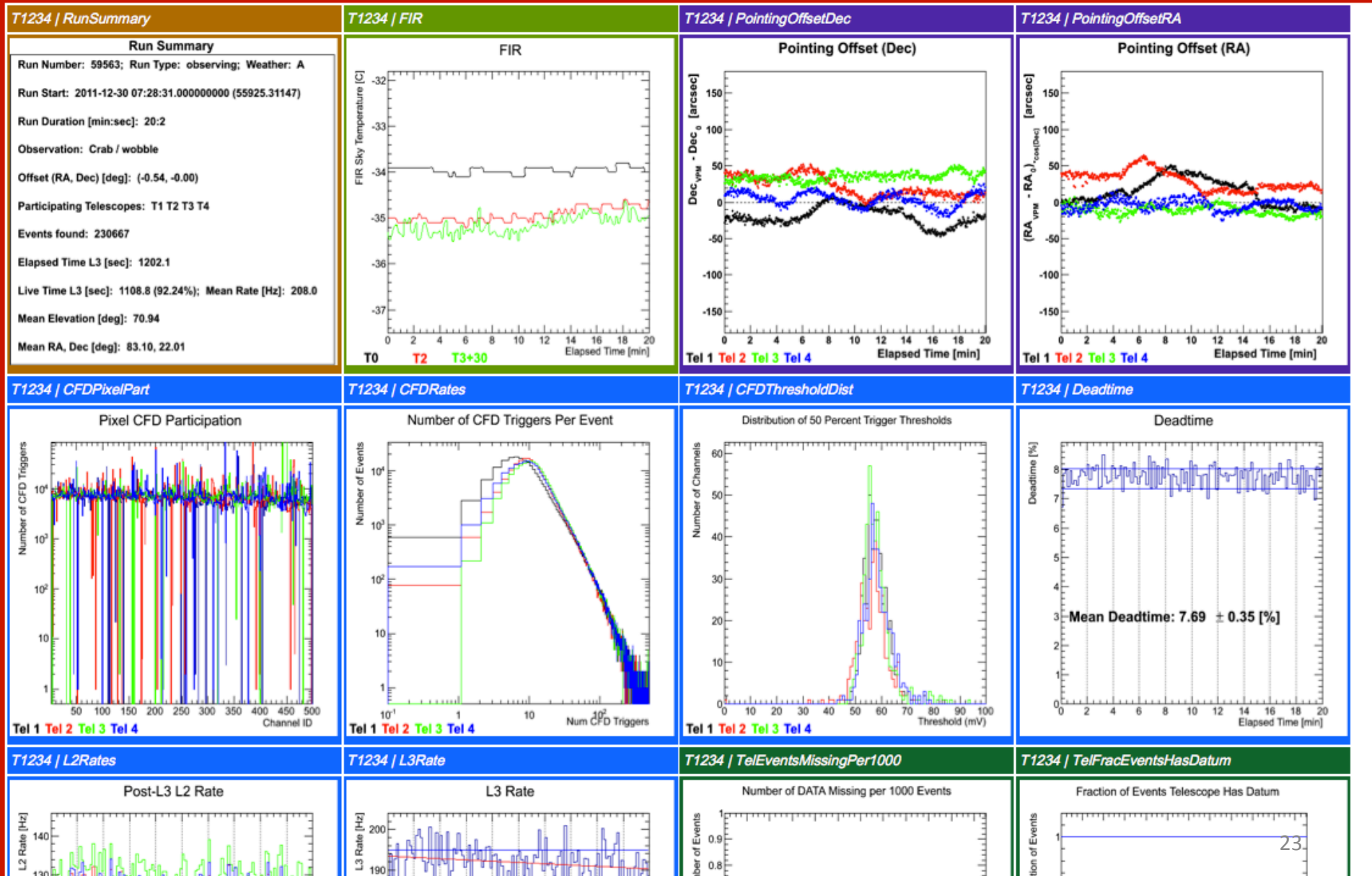
DATE	RUN	SOURCE	CALIB	UTC	DUR	USE	MODE	SKY	'T1'-FIR CRMS	T3-FIR CRMS	EL	AZ	Hz	TEL	NSB	FLG	CMT	
20111215	59183	Crab	1234/2	03:54	20	0 0.5N	B	0.1 (A)	0.2	45	89	37	2/1234	1.8 (d)	X(m);	1 a	+	
20111215	59186	Crab	1234/2	05:07	20	0 0.5S	B	0.2 (B)	0.2	60	102	52	2/1234	1.4 (l)	X(m);	2	+	
20111215	59191	Crab	1234/2	05:56	20	0 0.5E	B	0.1 (A)	0.3	70	113	29	2/1234	2.2 (l)	X(m);	3	+	
20111215	59192	Crab	1234/2	06:26	20	0 0.5W	B	0.1 (A)	0.3	76	131	34	2/1234	2.5 (l)	X(m);	4	+	
20111215	59193	Crab	1234/2	06:47	20	0 0.5W	B	0.1 (A)	0.2	79	149	31	2/1234	2.7 (l)	X(m);	5	+	
20111215	59194	Crab	1234/2	07:08	20	0 0.5N	B	0.1 (A)	0.2	81	171	30	2/1234	2.9 (l)	X(m);	6	+	
20111215	59195	Crab	1234/2	07:30	10	0 0.5S	B	0.1 (A)	0.1	80	194	30	2/1234	3.1 (l)	X(m);	7	+	
20111216	59228	Crab	1234/1	06:42	20	20 0.5N	A	0.1 (A)	0.2	79	144	63	2/1234	3.7 (l)	<s	8	+	
20111226	59410	Crab	1234/1	06:18	20	20 0.5S	A	0.1 (A)	0.2	79	163	197	2/1234	5.6 (d)	<s	b	+	
20111227	59451	Crab	1234/1	08:08	20	20 0.5S	A-	0.1 (A)	0.2	65	253	194	2/1234	5.8 (d)	<s		+	
20111227	59452	Crab	1234/1	08:29	20	20 0.5E	A-	0.1 (A)	0.2	62	258	190	2/1234	5.9 (d)	<s	9	+	
20111229	59521	Crab	1234/1	05:41	20	20 0.5W	A	0.1 (A)	0.3	77	138	194	2/1234	5.3 (d)	<s		+	
20111229	59522	Crab	1234/1	06:01	20	20 0.5N	A	0.1 (A)	0.2	80	155	194	2/1234	5.2 (d)	<s		+	
20111229	59523	Crab	1234/1	06:23	20	20 0.5S	A	0.1 (A)	0.2	80	186	198	2/1234	5.3 (d)	<s		+	
20111230	59562	Crab	1234/1	07:08	20	20 0.5E	A	0.2 (B)	0.3	75	233	196	2/1234	5.3 (d)	<s		+	
20111230	59563	Crab	1234/1	07:29	20	20 0.5W	A	0.2 (B)	0.1	71	246	192	2/1234	5.5	<s		+	
					<b>19.4</b>						<b>72.4</b>	<b>116.3</b>		<b>MEANS</b>				
<b>16</b>					<b>310</b>	<b>180</b>												<b>TOTALS</b>

All the most important information on one page. More details on DQM page.

# Data Quality Monitoring

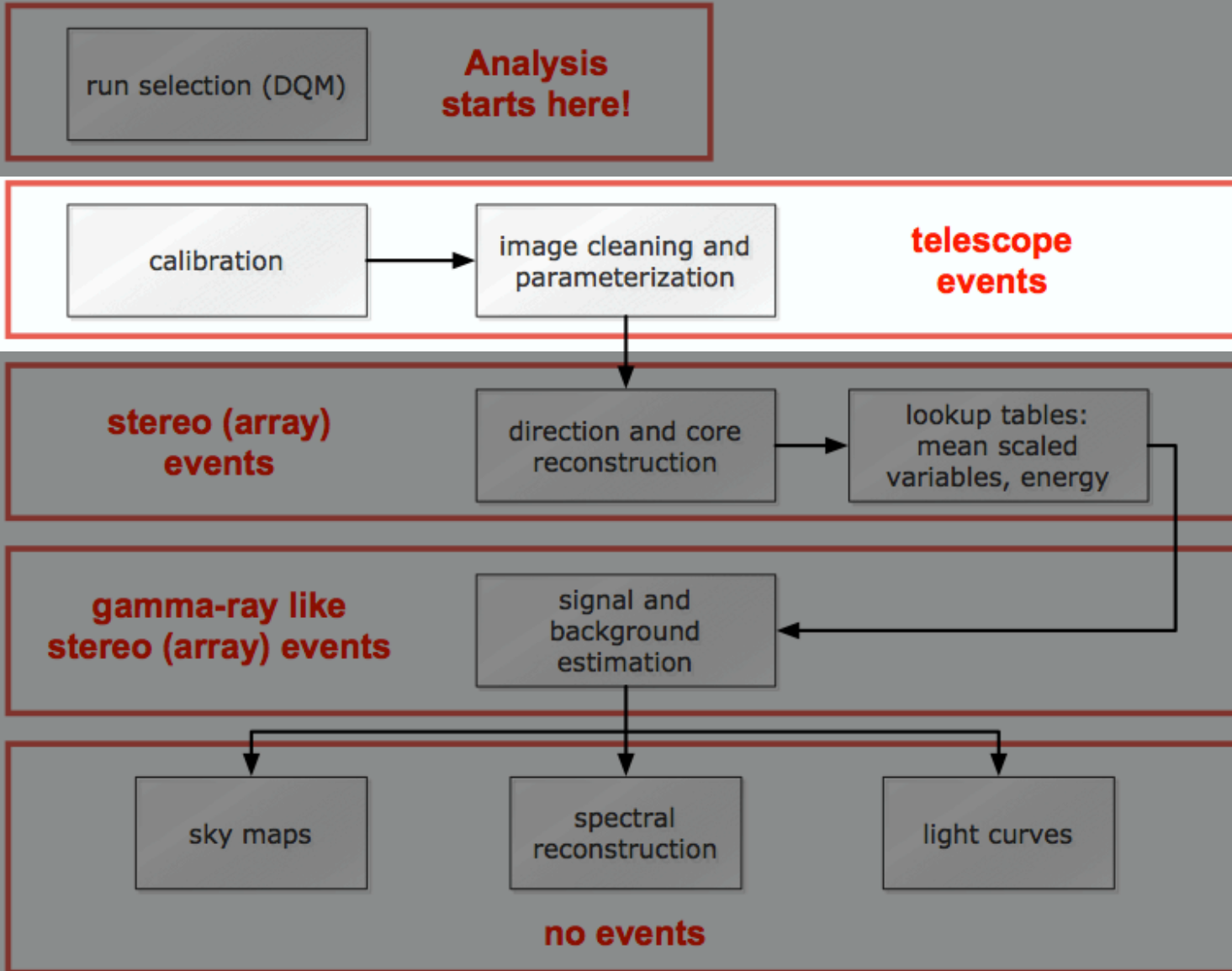


- ‘Standardized’ run selection
  - Every collaborator takes part in DQM shifts
- Web interface provides many low-level plots for determining data quality
  - Generally performed by noon following day
  - Allows for fast turnaround in fixing problems
- A good starting place for runlist
  - Different analyses may have different quality requirements



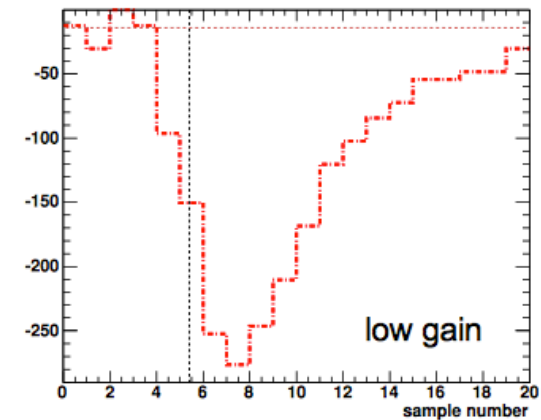
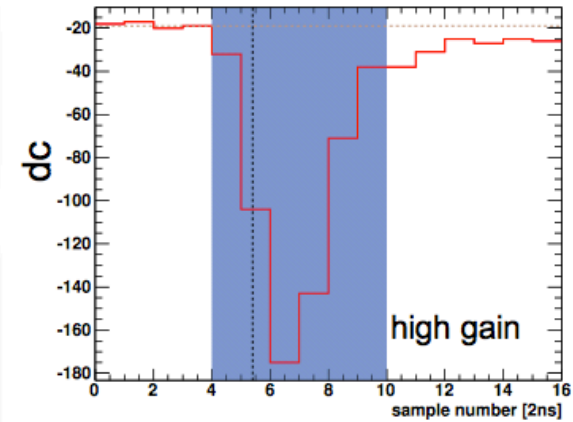
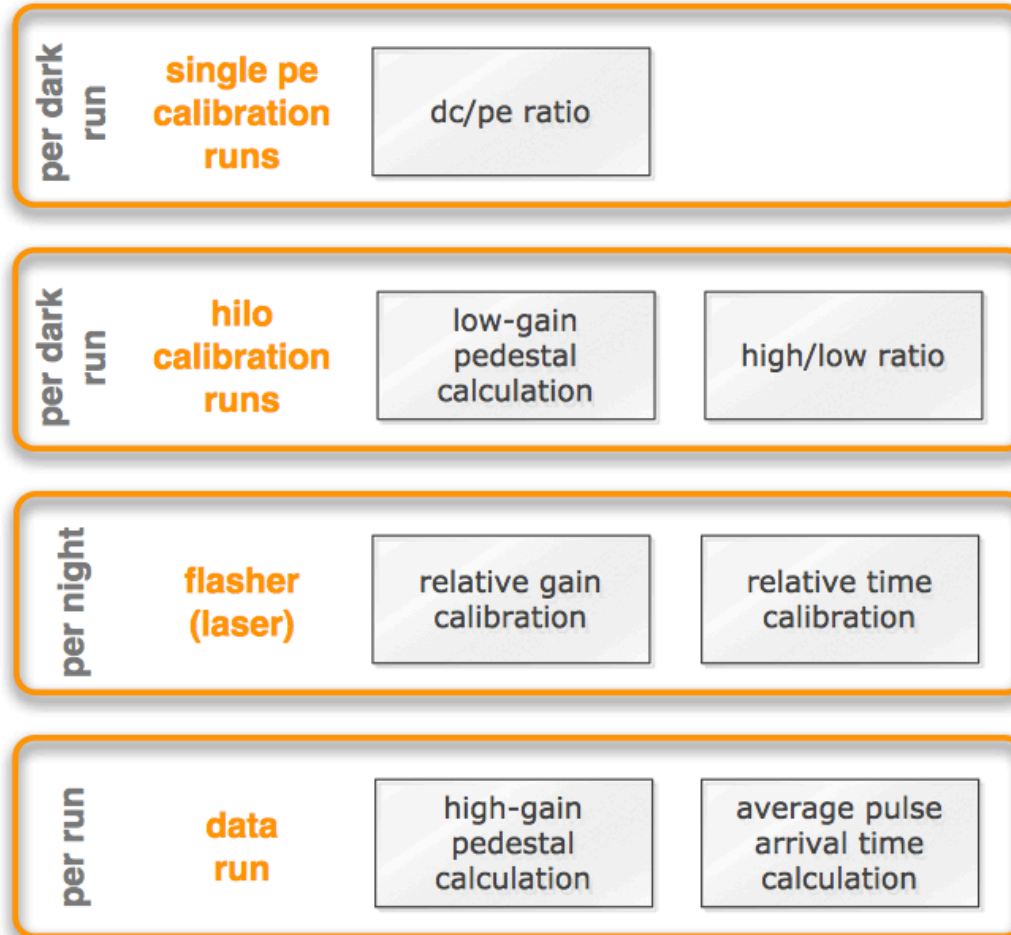


# Analysis Overview



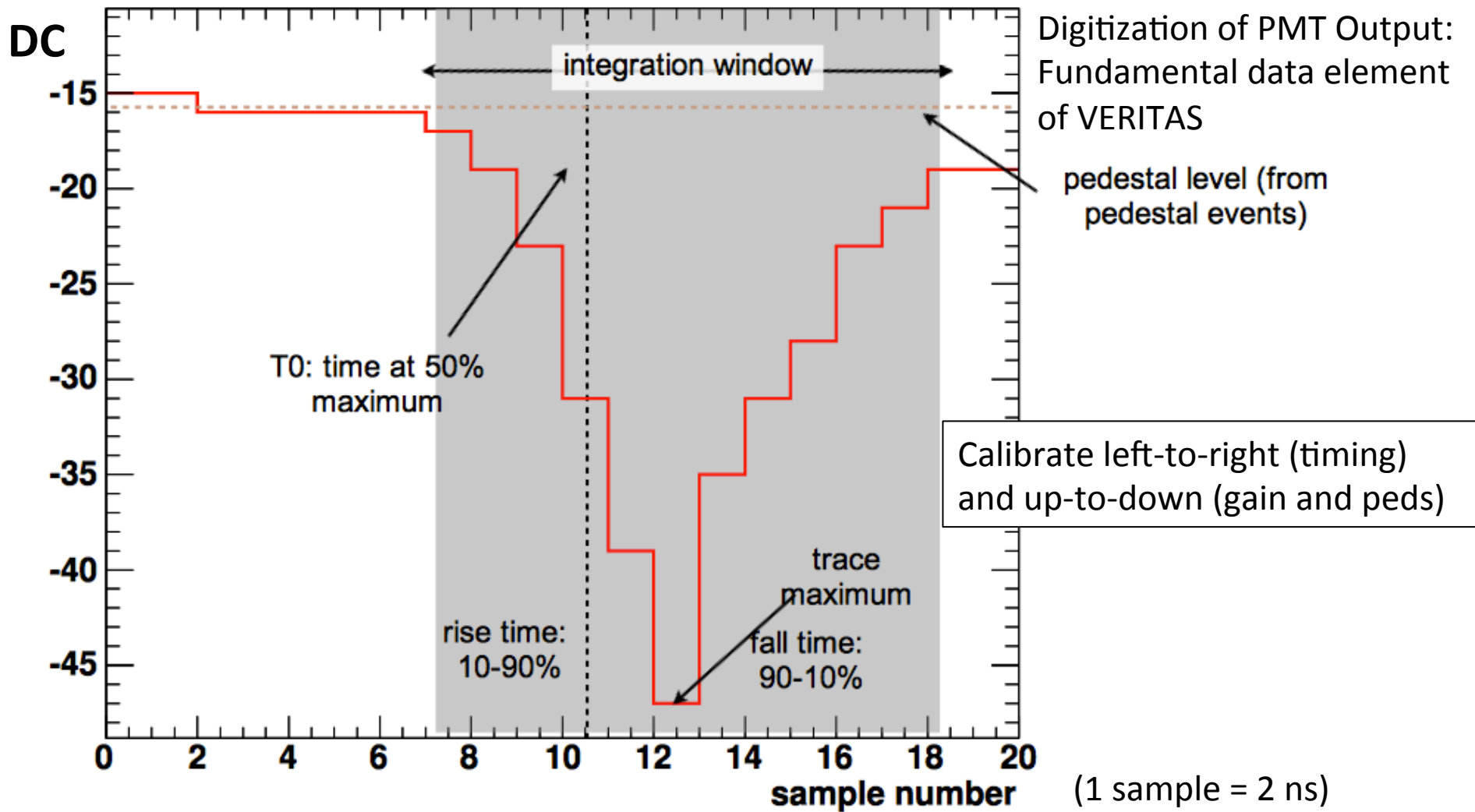


# Calibration





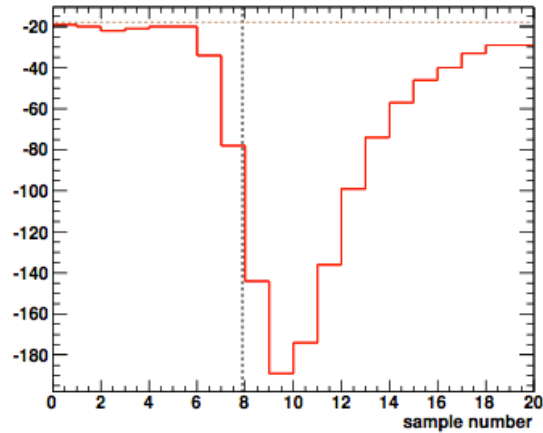
# FADC Trace



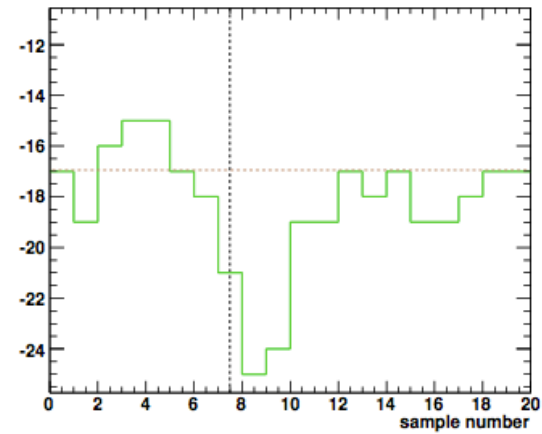


# FADC Traces

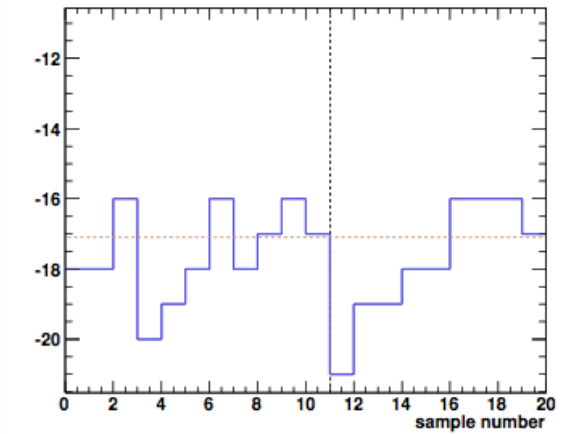
Channel #193 (Telescope 2)



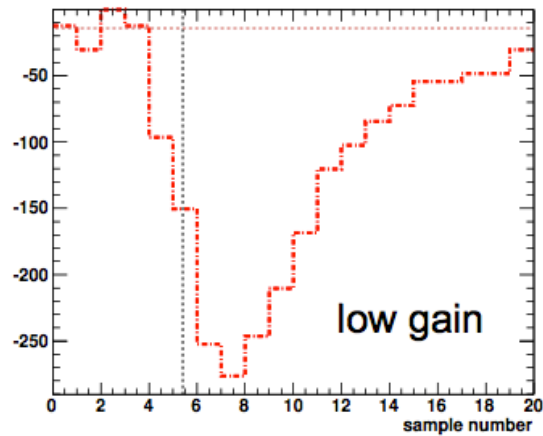
Channel #435 (Telescope 2)



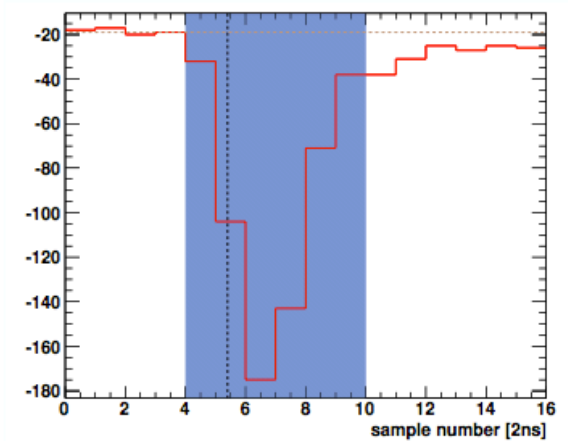
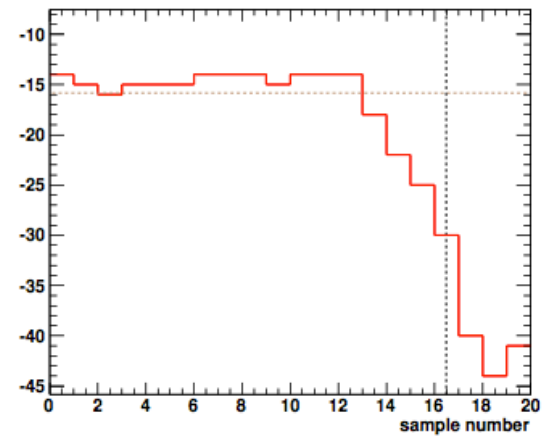
Channel #85 (Telescope 2)



Channel #194 (Telescope 2)



Channel #79 (Telescope 1)

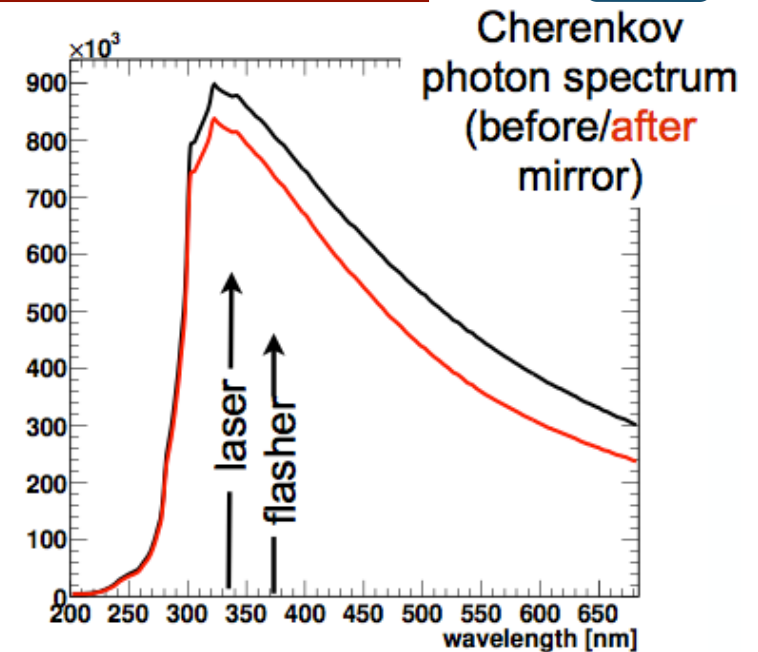




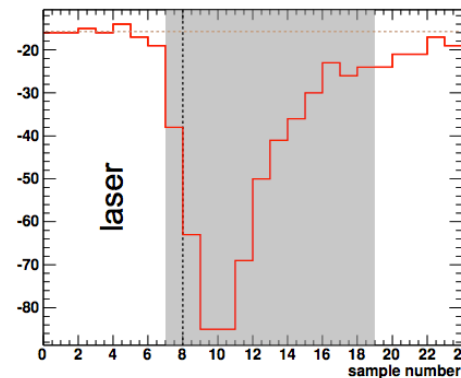


# Flasher/Laser Calib Runs

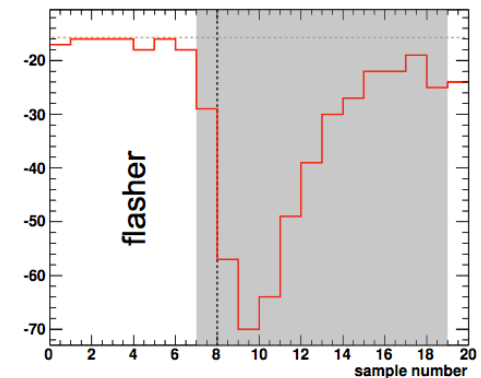
- Purpose: provide photon pulses that are time-coincident and uniformly bright across camera
- <2009: Nitrogen laser @ 330 nm
  - 5 min runs at 10 Hz
- >2009: 7 LED flasher @ 370 nm
  - 2 min runs at 300 Hz



Channel #197 (Telescope 2)



Channel #197 (Telescope 2)



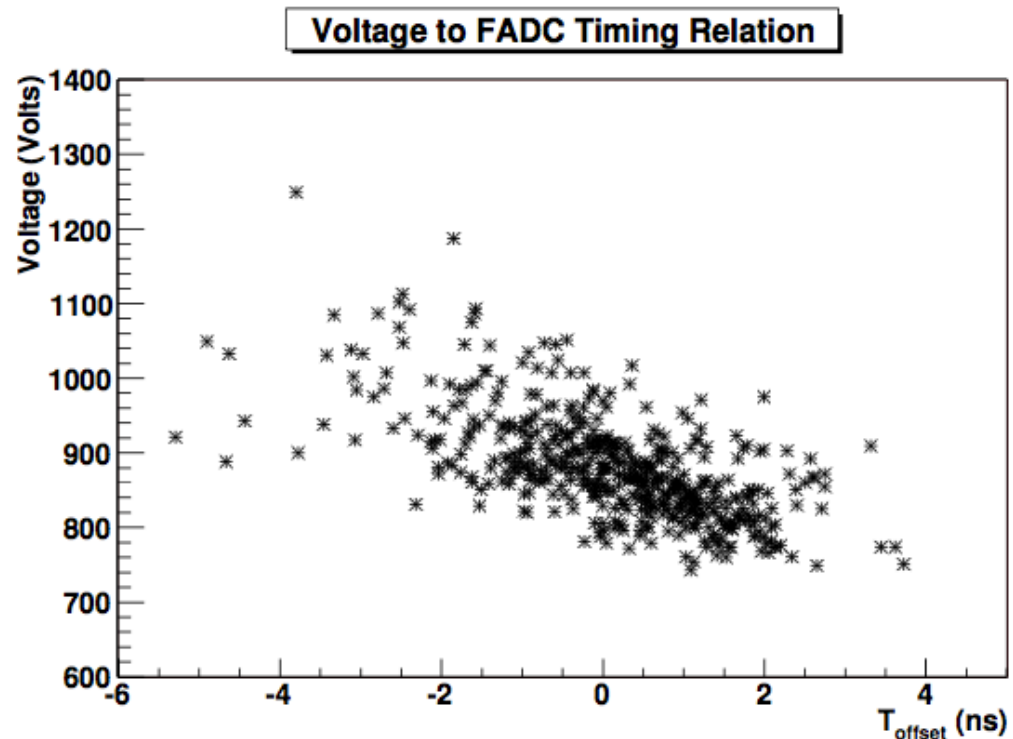




# Relative Timing

- Flasher/Laser provides time-coincident light to all PMTs
- Remaining time differences must be related to PMT/electronics
- We change our HV routinely for moon

PMT HV vs  
Timing delay

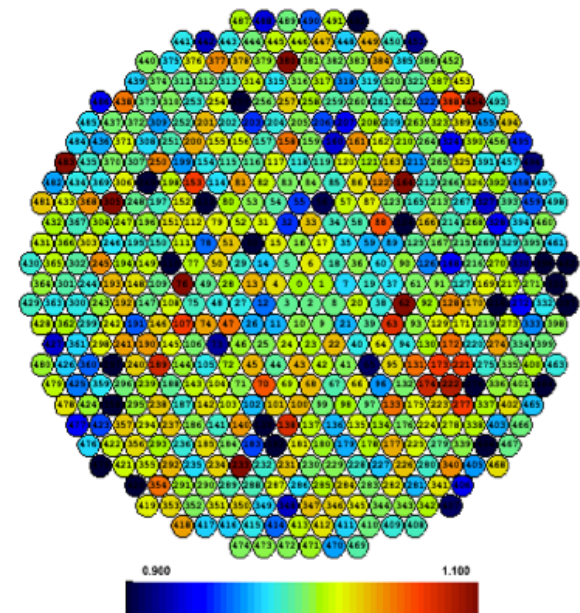
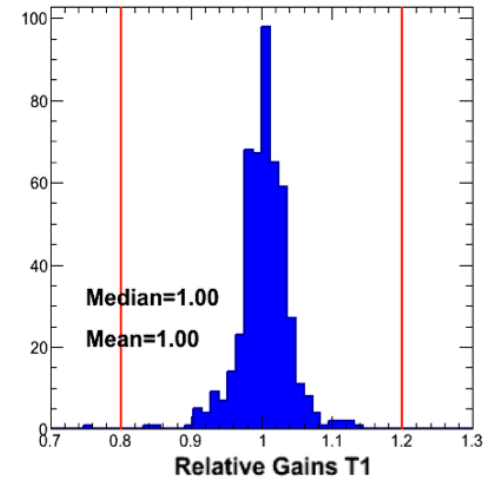




# Relative Gain

- Basic idea: In a flasher event, compare the charge seen in a single pixel to the average over the whole camera
- Simplest 'laser' method
  - Histogram  $Q_i / \langle Q \rangle$  of high-gain chans,
  - Get the mean  $\rightarrow$  rel gain
  - Get the RMS  $\rightarrow$  rel gain var
- Advanced 'flasher' method
  - Fill 2D Profile with  $Q_i$  vs  $\langle Q \rangle$
  - Fit with line, slope is rel gain

Histogram Of Relative Gains T1

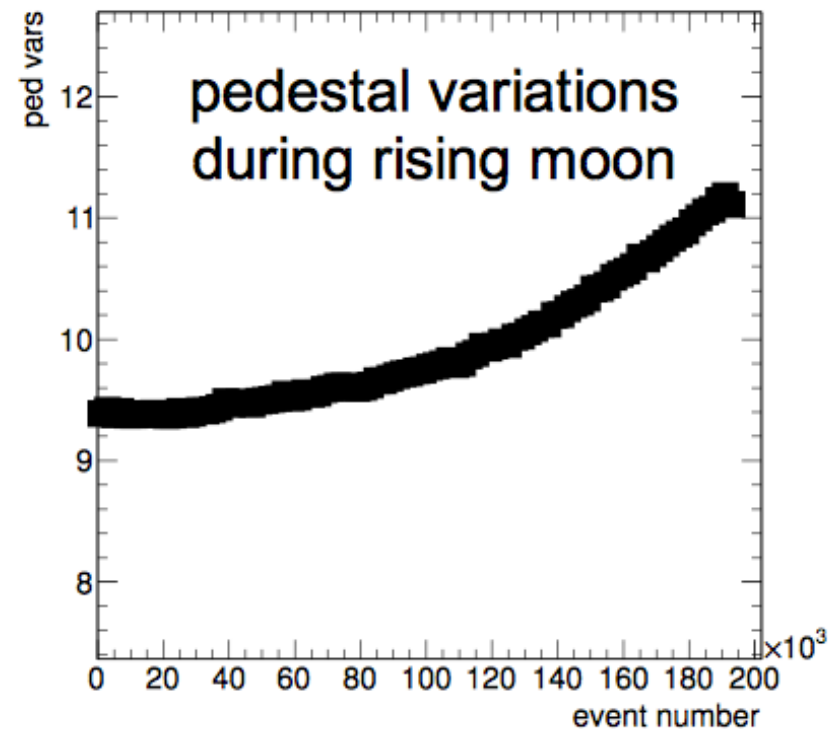




# Pedestals

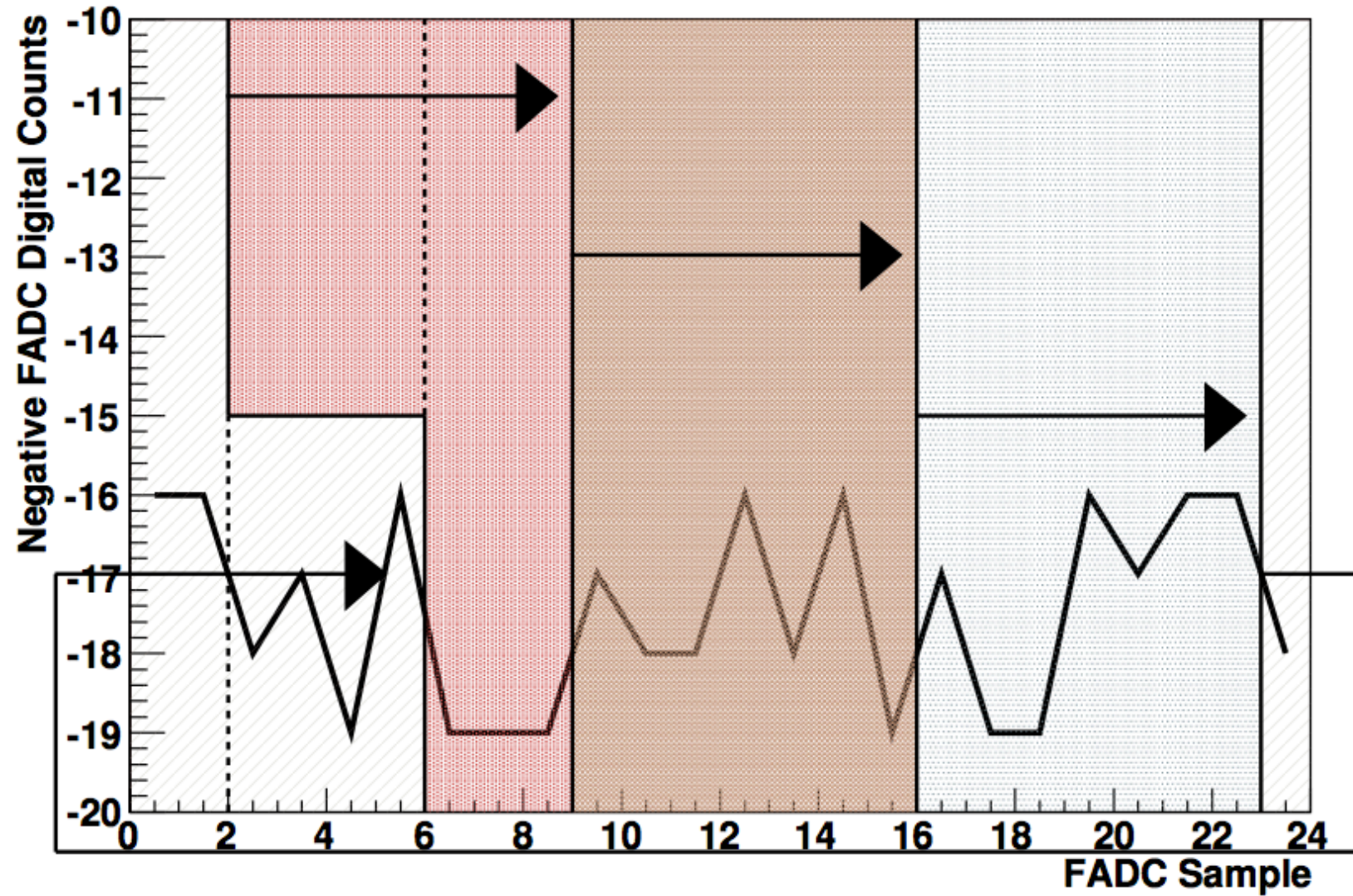
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- During the data run itself, 'pedestal' events are triggered at a rate of 3 Hz
- We inject a pedestal (DC offset from 0) into the trace so we can characterize + and - fluctuations
- Ped and Ped Variance (*pedvar*) are calculated in 3-min time slices
  - Pedvar depends on NSB





# Pedestals

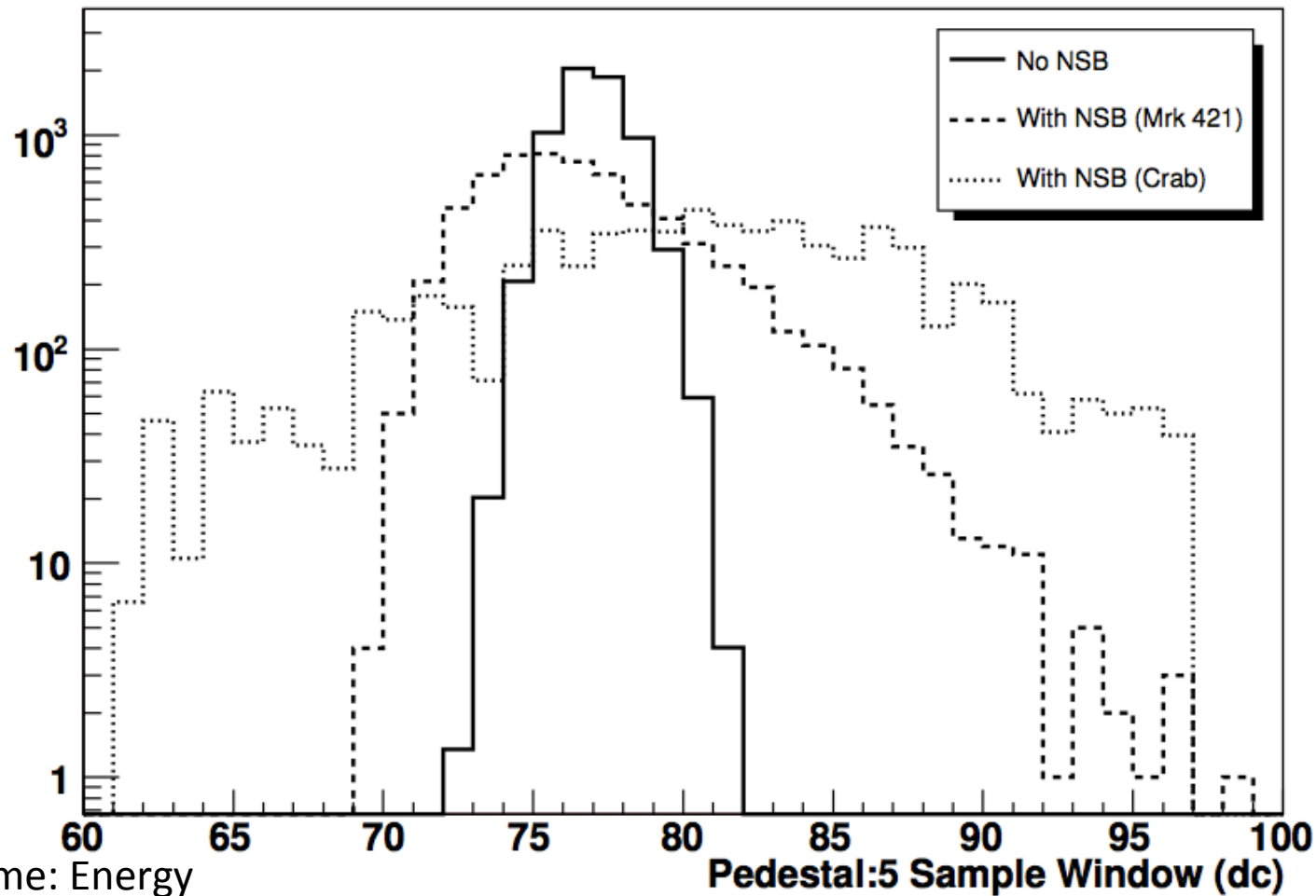






# Pedestals

## Pedestal Distribution With and Without NSB

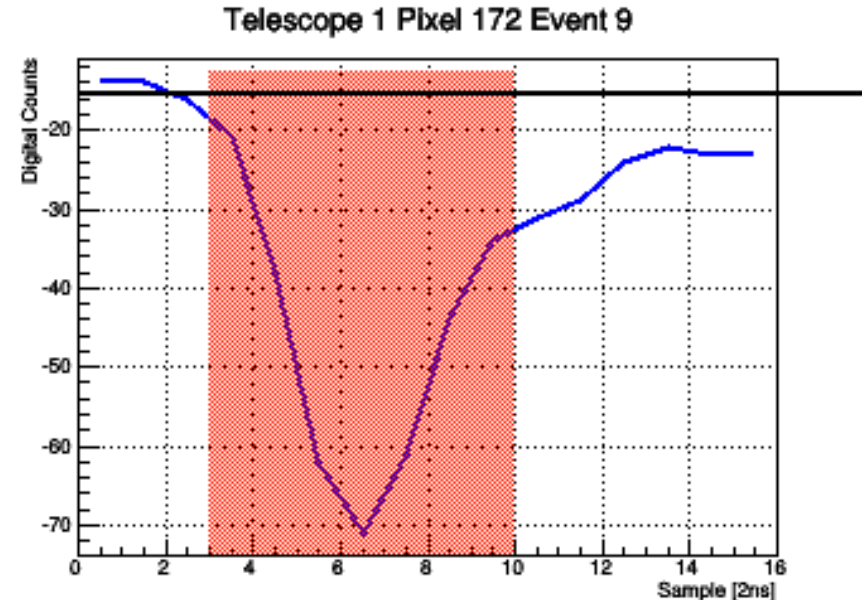


Take home: Energy threshold depends on field



# FADC Trace Integration

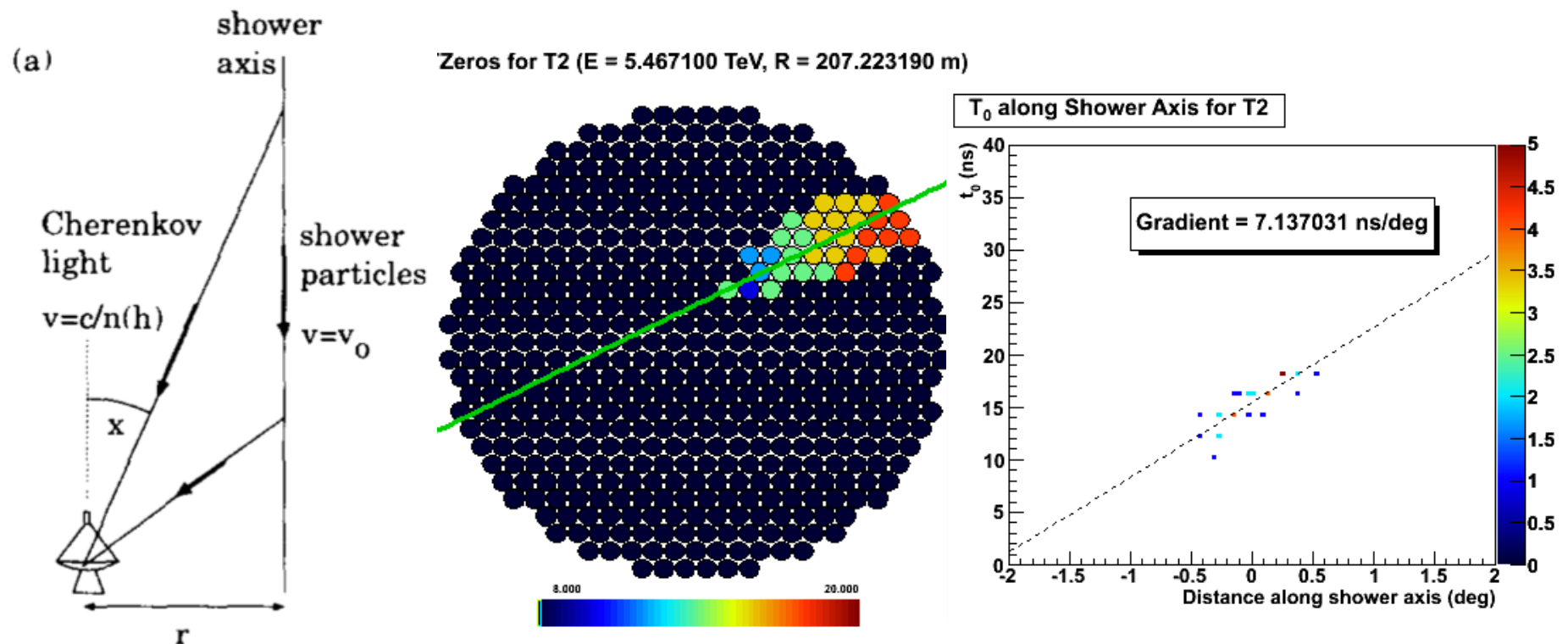
- Use duration which maximizes S/N
  - 7 samples fixed duration in VEGAS
  - ED expands to entire trace for low gain traces
- Strategies for window placement
  - Static window
  - Dynamic window
    - i.e. Double-pass





# Double Pass Placement

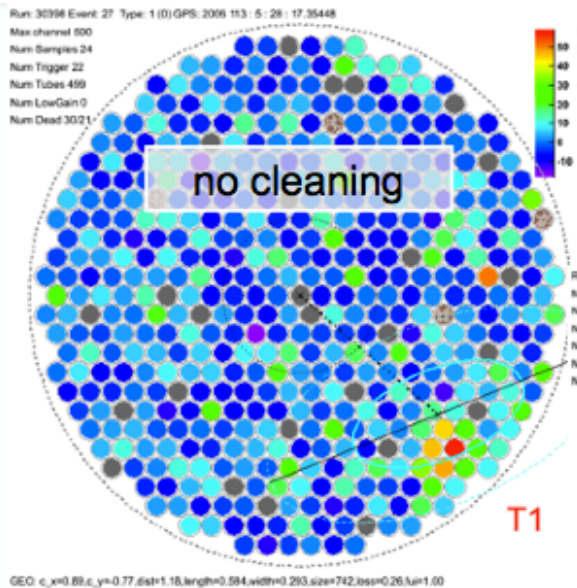
- Fit photon arrival times along first-pass shower axis
- Use time gradient to place FADC integration window



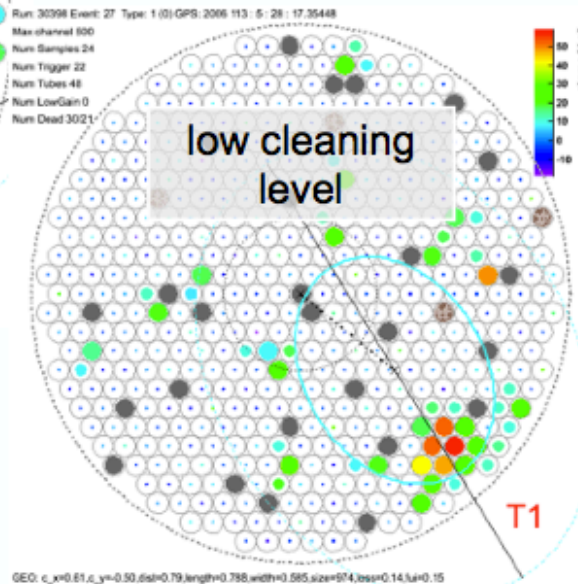
- Window placement determined from neighboring pixels – no bias



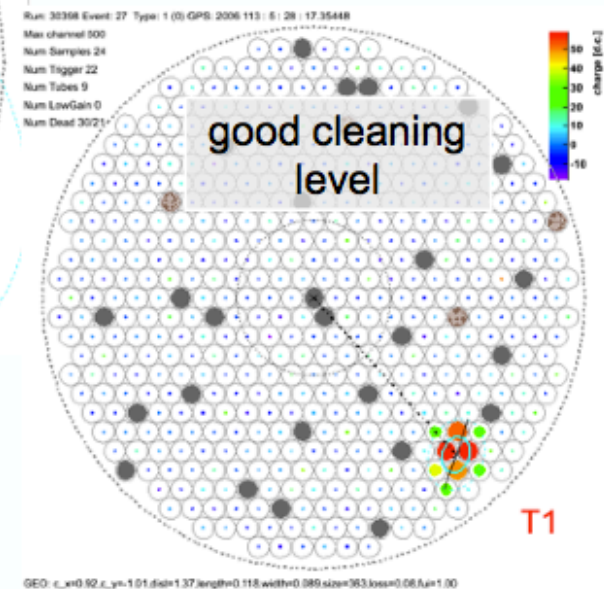
# Image Cleaning



remove pixel with low signal/noise ratios  
(taking into account expected noise and  
time evolution of signal)



- several cleaning methods:
- fixed cleaning levels
  - variable cleaning levels
  - time cleaning



two-level cleaning: remove  
pixels where neighbors  
have no signal





# Hillas Parameters

a.k.a Principle Component Analysis  
or moment analysis

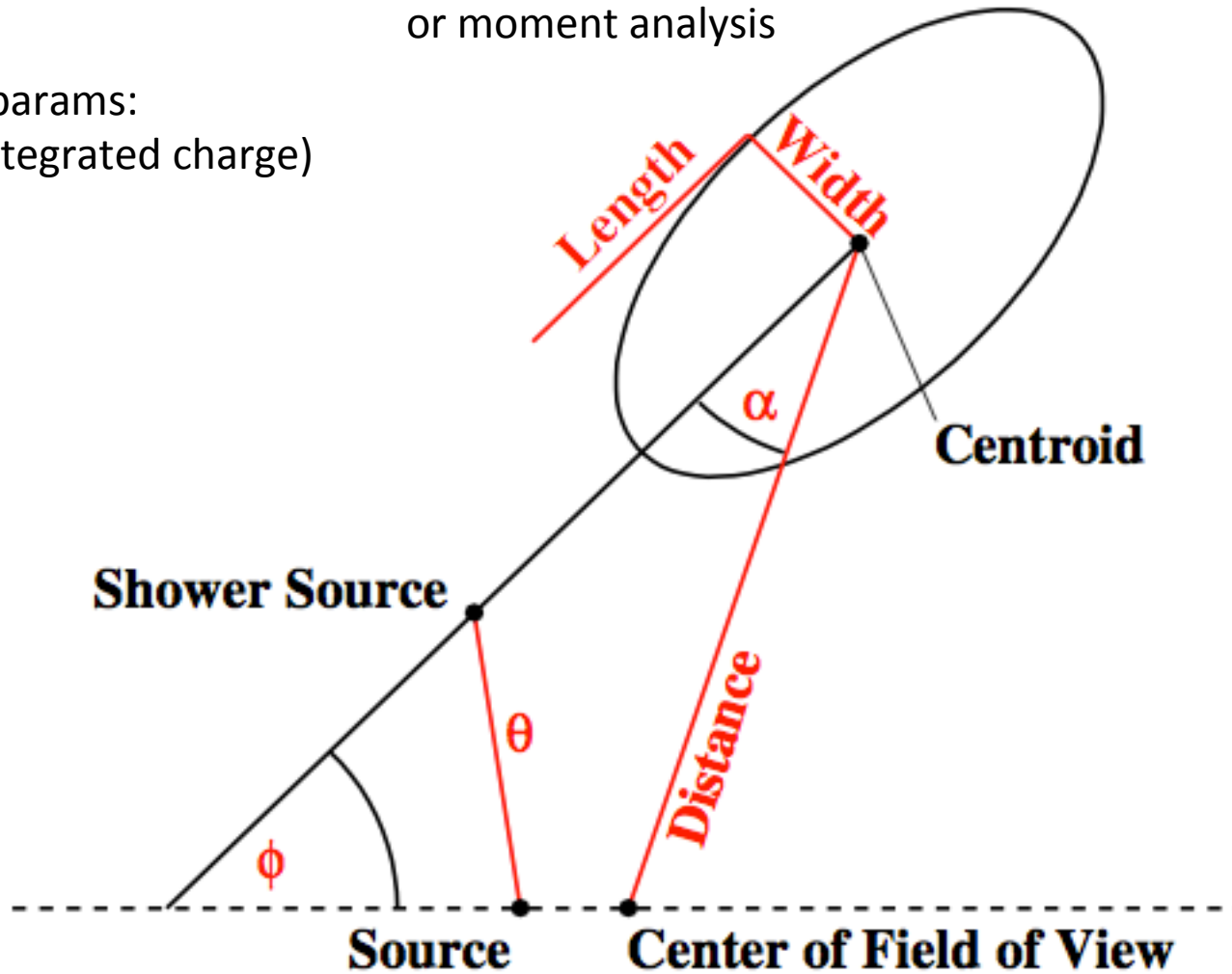
Notable params:

Size (integrated charge)

Length

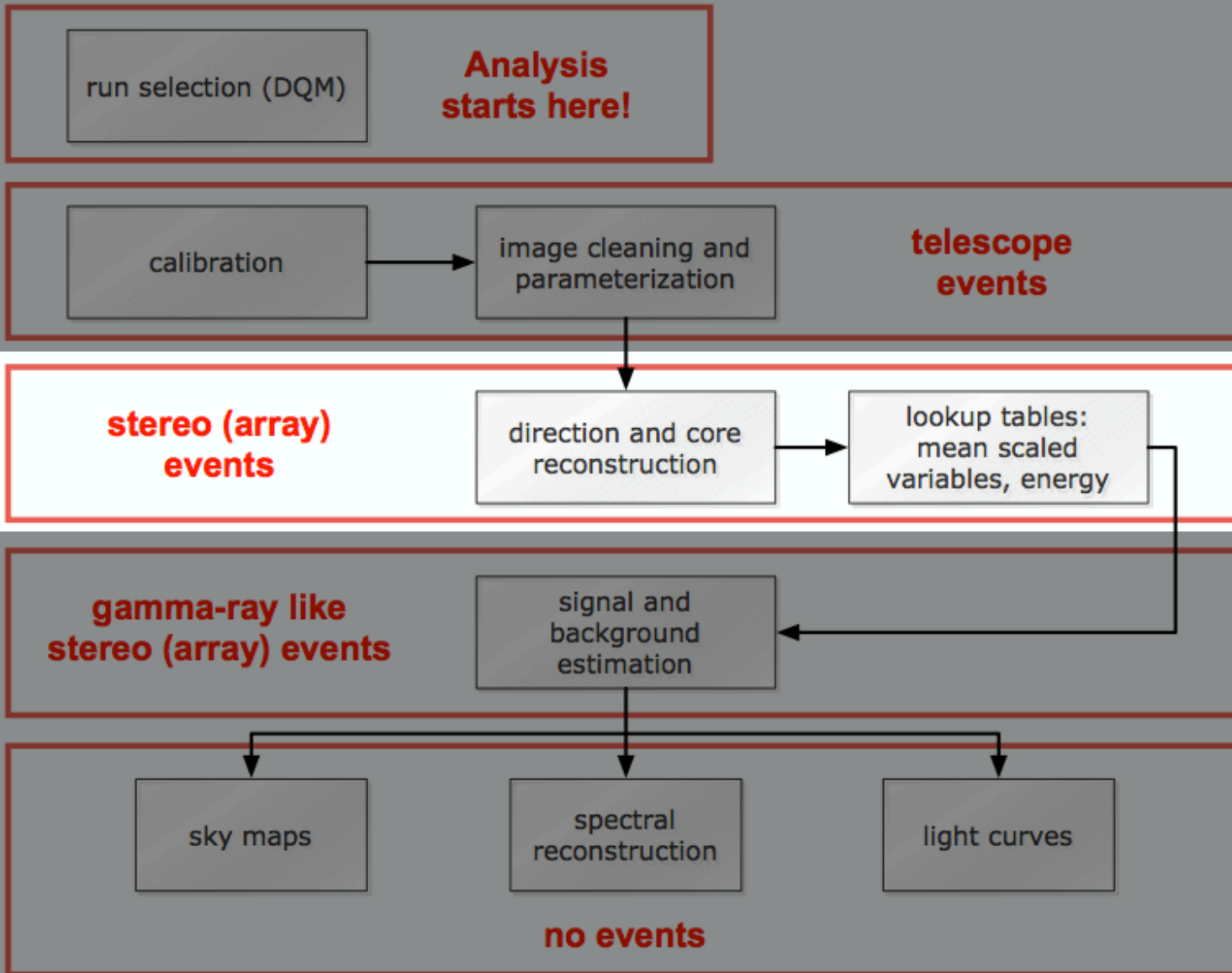
Width

Dist





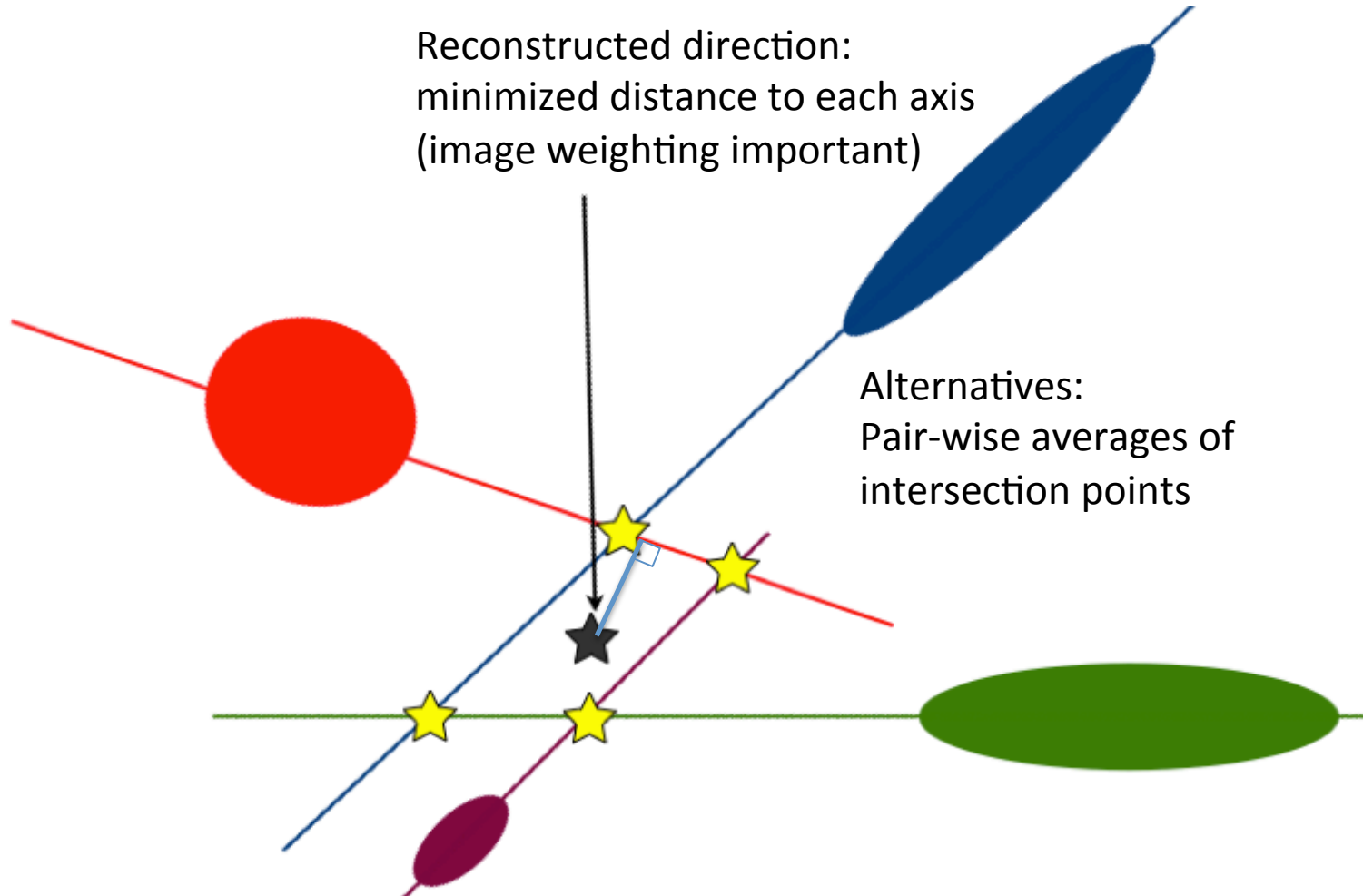
# Analysis Overview





# Direction Reconstruction

Reconstructed direction:  
minimized distance to each axis  
(image weighting important)

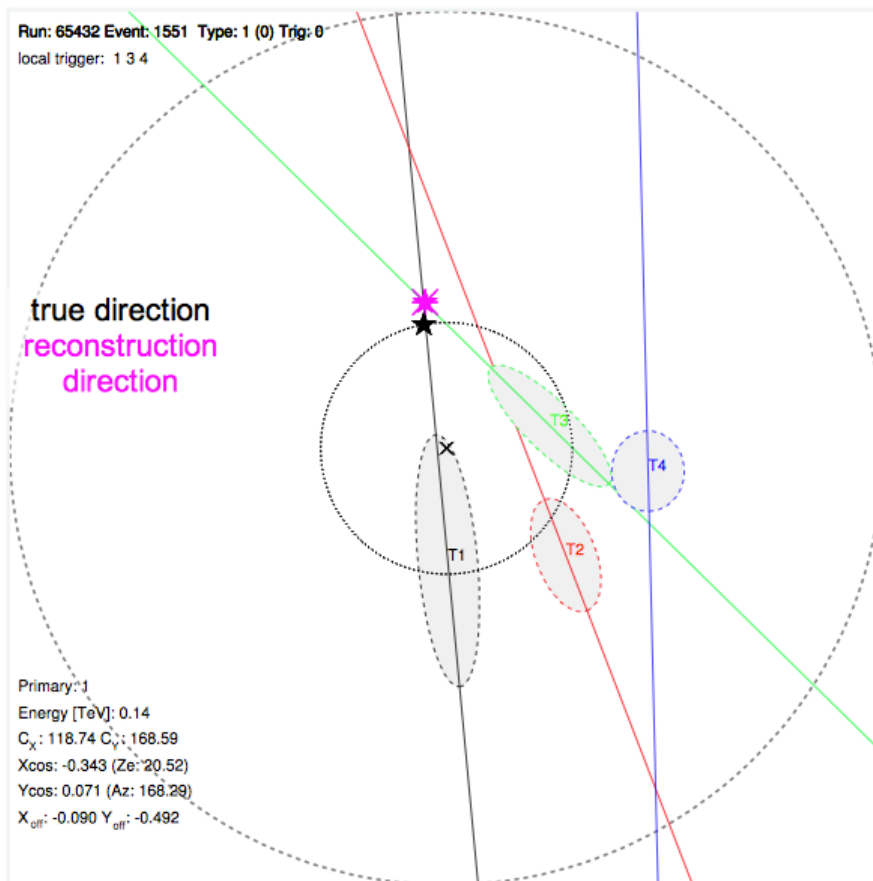


Alternatives:  
Pair-wise averages of  
intersection points



# Direction Reconstruction

- Crucial to decide which telescopes are worth considering



- Telescope-level cuts apply
- E.g. Soft cuts:

DistanceUpper 0/1.43  
SizeLower 0/200  
NTubesMin 0/5

- Format is “Tel/Value” with Tel=0 applying to all tels

*Tel events are cut from recon*



# vaDisplay Exercise

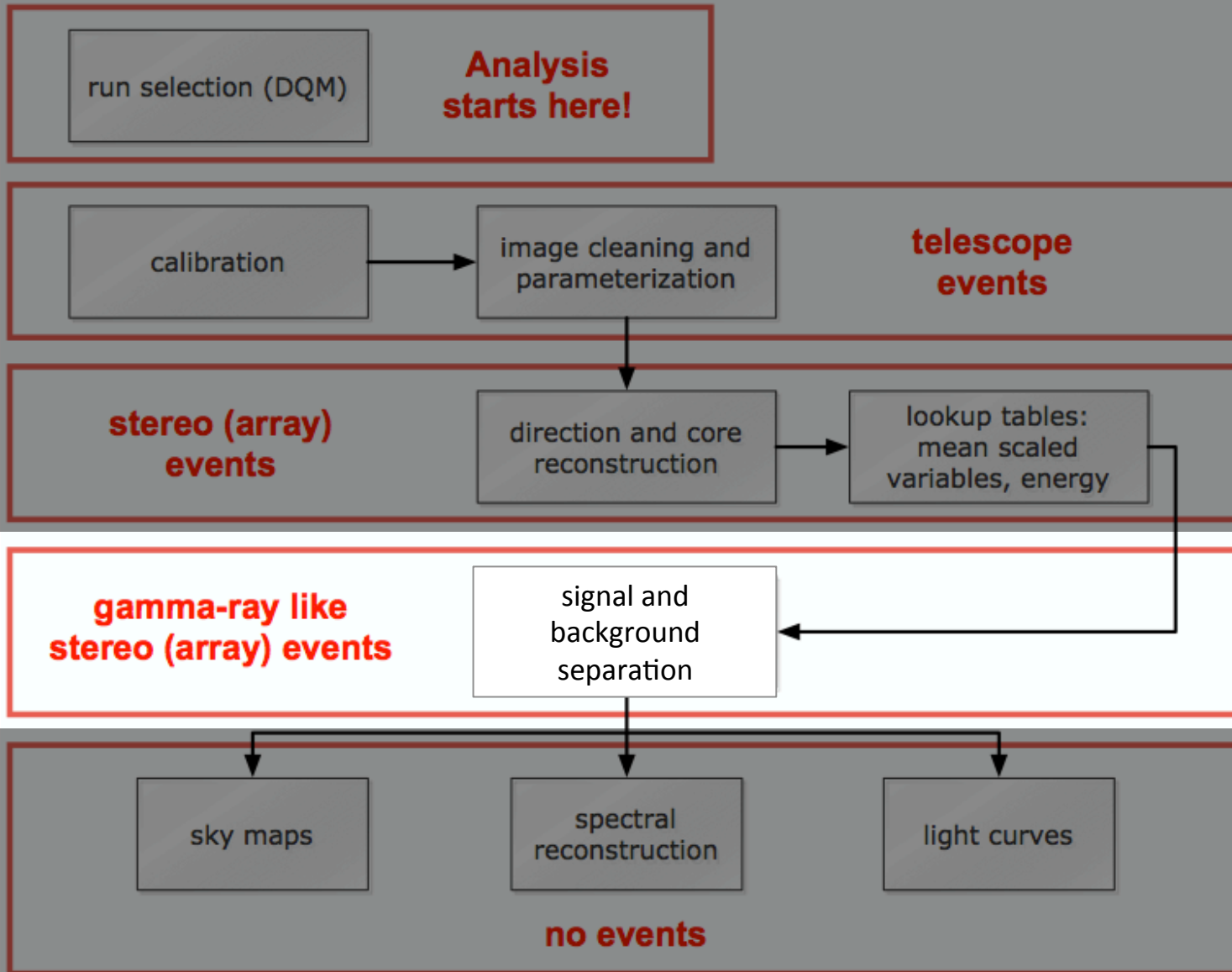
- Use vaDisplay to examine VERITAS events:

```
]$ cd /home/fermi
]$ source veritasinit.csh
]$ cd VERITAS
Look at flasher run:
]$ vaDisplay CrabAnalysis-calib/59534.root
Look at data run:
]$ vaDisplay CrabAnalysis-calib/59521.root
```

- Flasher scavenger hunt:
  - What is pattern of # of LEDs flashed?
    - Hint: H.fSize is integrated light in image. Ignore first few events and look for pattern.
  - What charge threshold activates Low-gain switch?
    - Hint: As #LEDs ramps up, pixels fluctuating up will switch first. Use Display Mode “HiLo” to identify channels that have switched to lower gain. T1 flasher too dim! Look at Display Control: T2 Image.
  - Is the Hillas parameterization of a flasher event what you expected?
    - Hint: Use “Display Hillas Fit”
- Data scavenger hunt:
  - Find a muon ring (at least a partial one).
    - Hint: Turn on Display Control: “All-Images” and Cleanup: “eventDisplay”
  - Find a BIG CR or gamma. Did it land inside the array?
    - Hint: Display Mode “Ground” Shows core reconstruction location on ground



# Analysis Overview



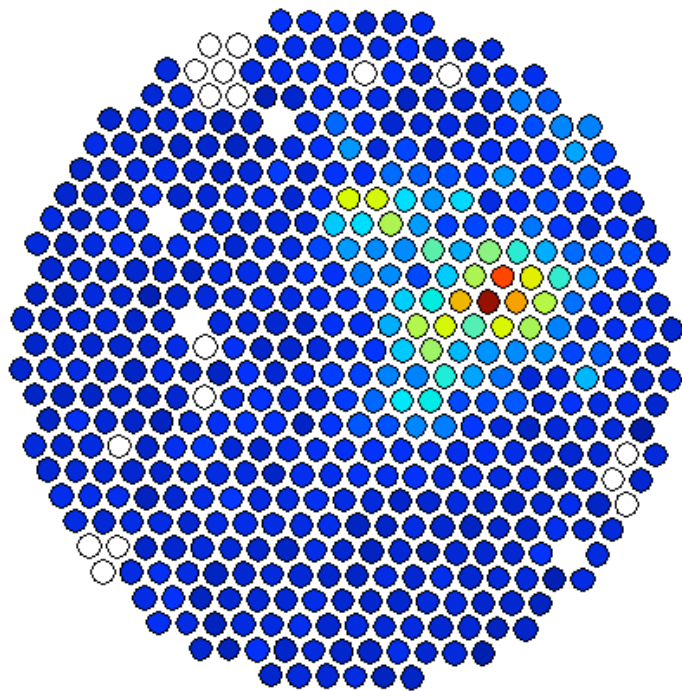


# Gamma/Hadron Separation



**Cosmic Ray**

Run:65255: 97

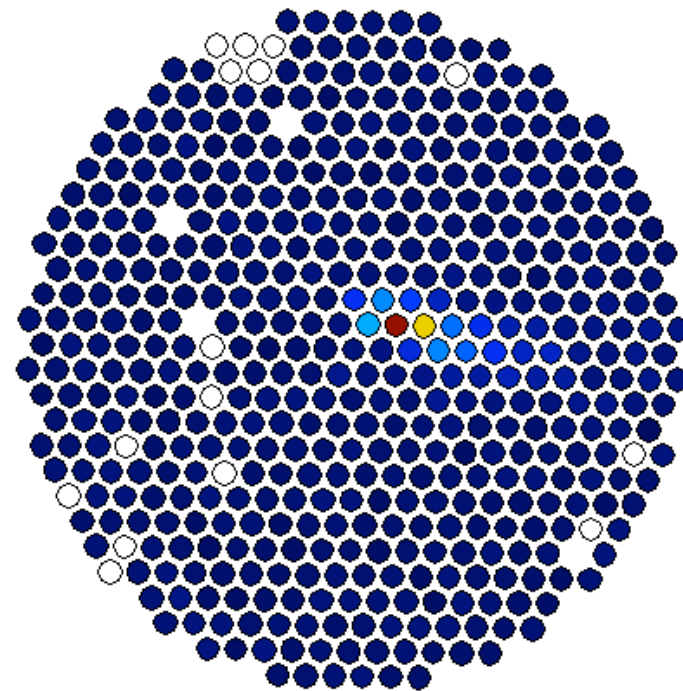


Not Pmts  
110 ○  
249 ○  
255 ○  
404 ○  
499 ○



**Gamma Ray**

Run:65255: 462351



Not Pmts  
110 ○  
249 ○  
255 ○  
404 ○  
499 ○

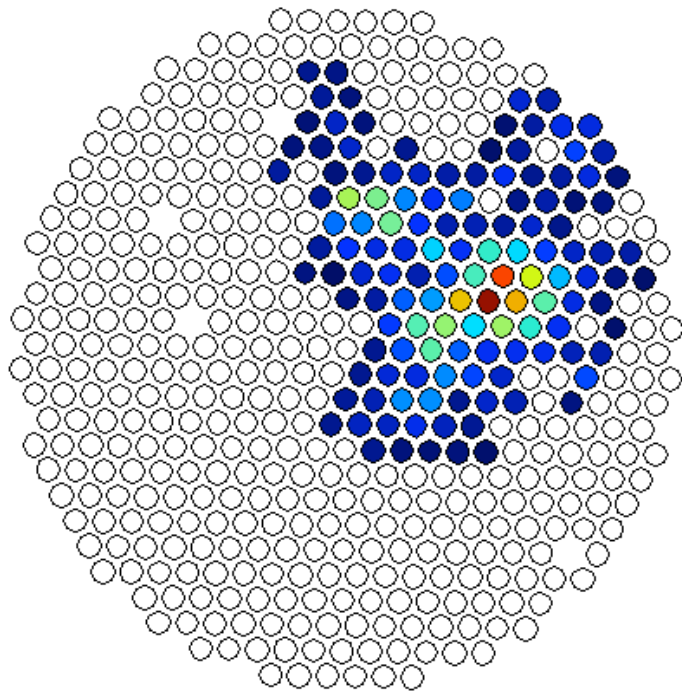


# Gamma/Hadron Separation



**Cosmic Ray**

Run:65255: 97

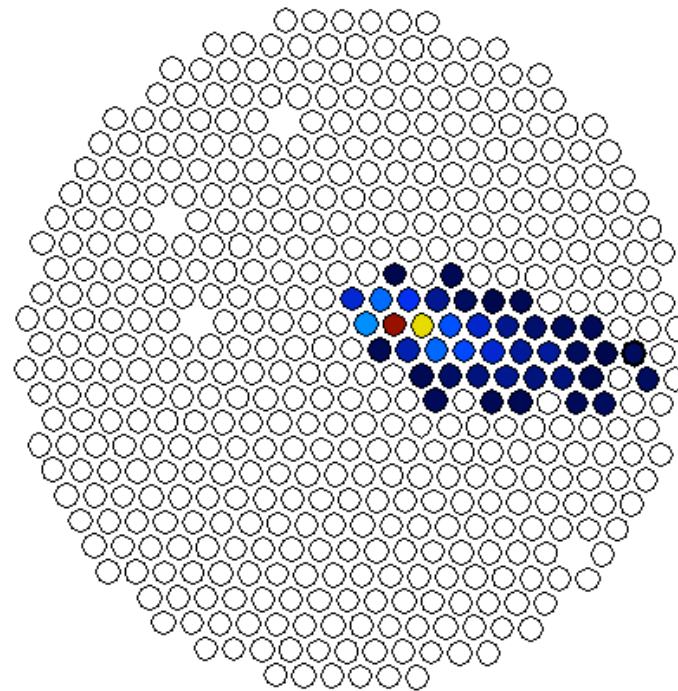


Not Pmts  
110 ○  
249 ○  
255 ○  
404 ○  
499 ○



**Gamma Ray**

Run:65255: 462351



Not Pmts  
110 ○  
249 ○  
255 ○  
404 ○  
499 ○



# Gamma/Hadron Separation

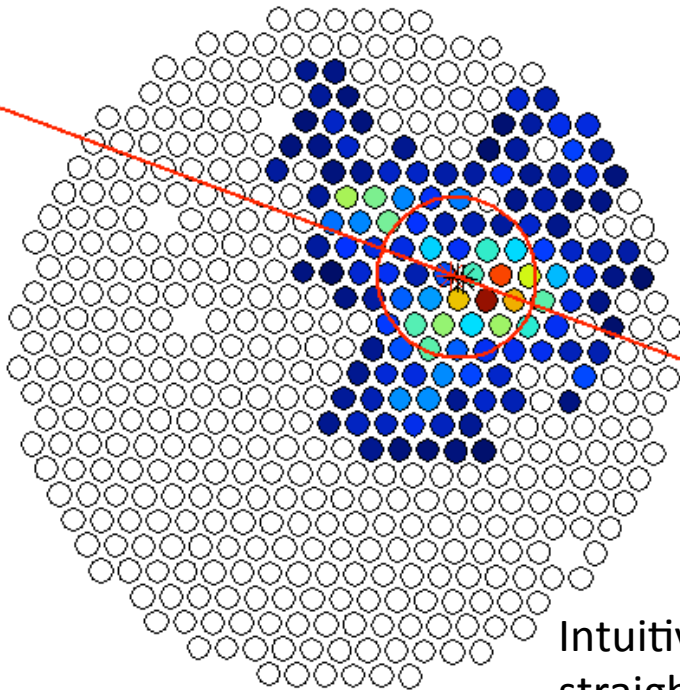


## Cosmic Ray

\*:Sng Tel Prime Src  
\*:Sng Tel Scnd Src  
+:Image Centroid

Run:65255: 97

Not Pmts  
110  
249  
255  
404  
499

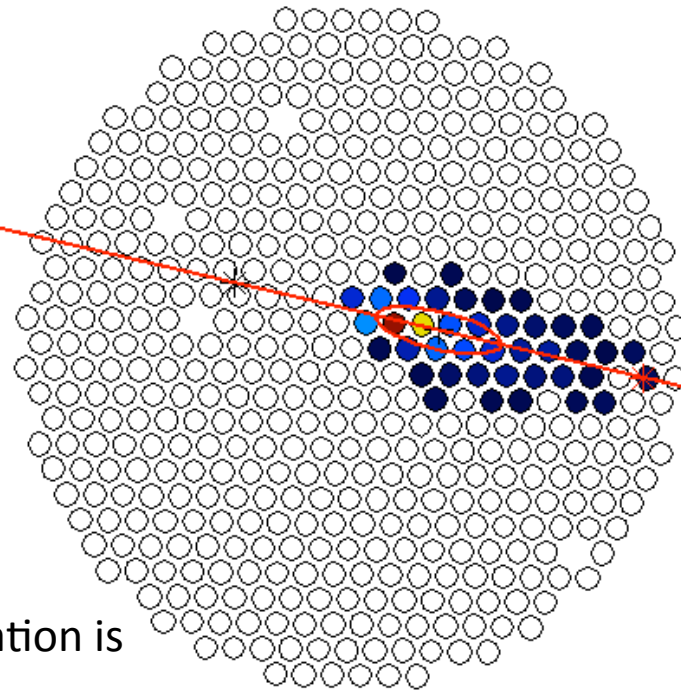


## Gamma Ray

\*:Sng Tel Prime Src  
\*:Sng Tel Scnd Src  
+:Image Centroid

Run:65255: 462351

Not Pmts  
110  
249  
255  
404  
499



Intuitively, separation is straight forward

In practice, width etc. depend on geometry and amount of light

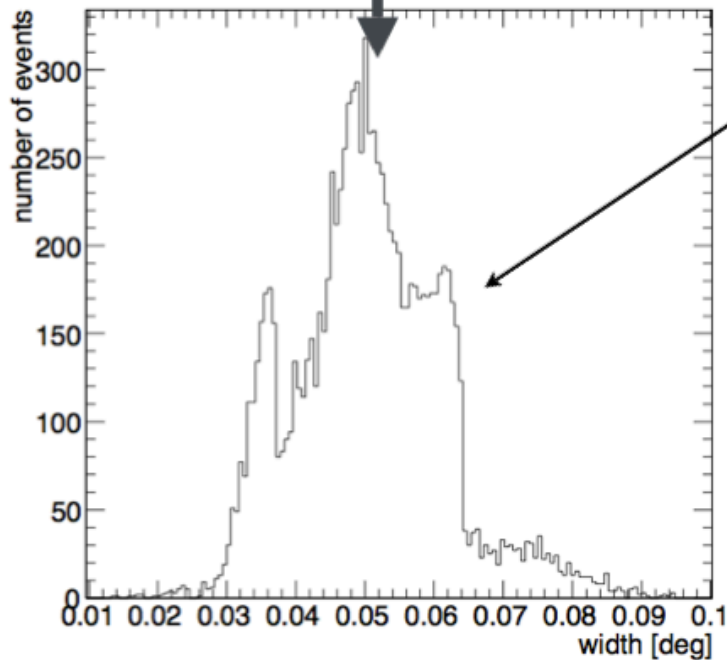
→ Lookup tables

# Lookups

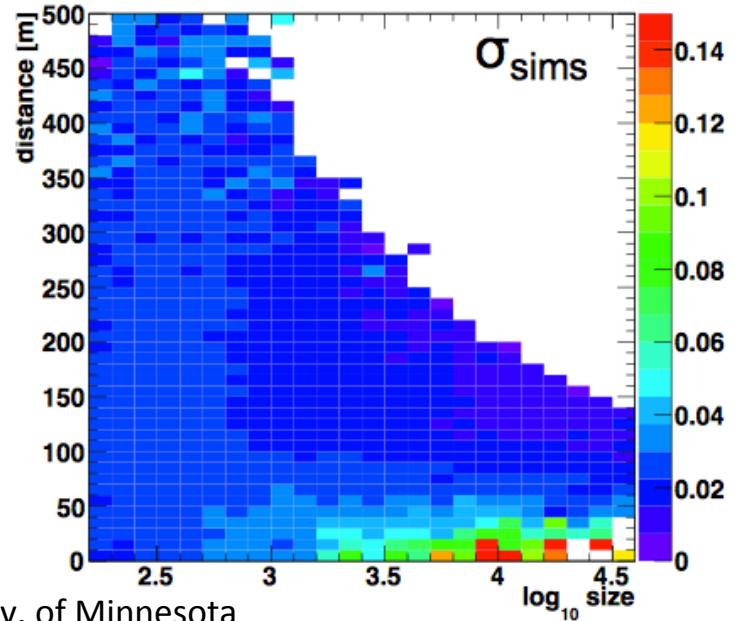
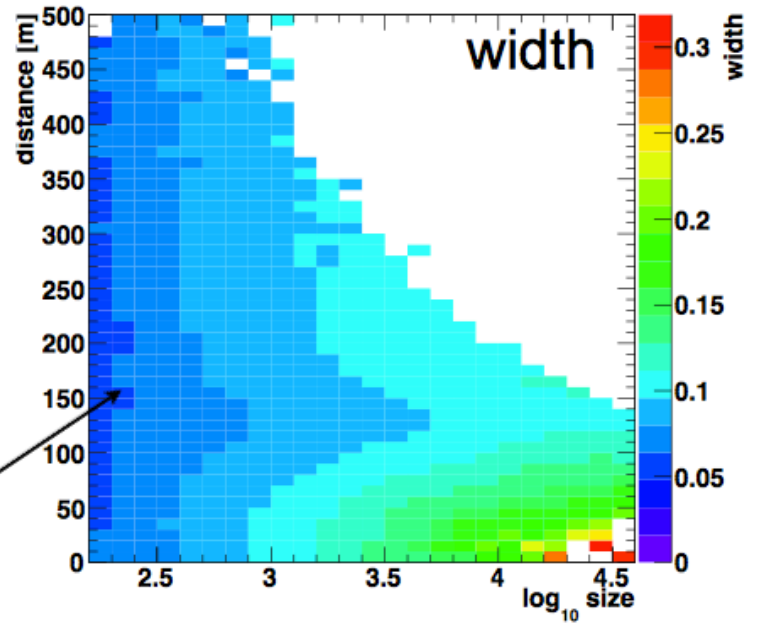
width distribution for a given size, distance, zenith and azimuth angle, noise level and offset from the camera centre

centre

Filled with simulations

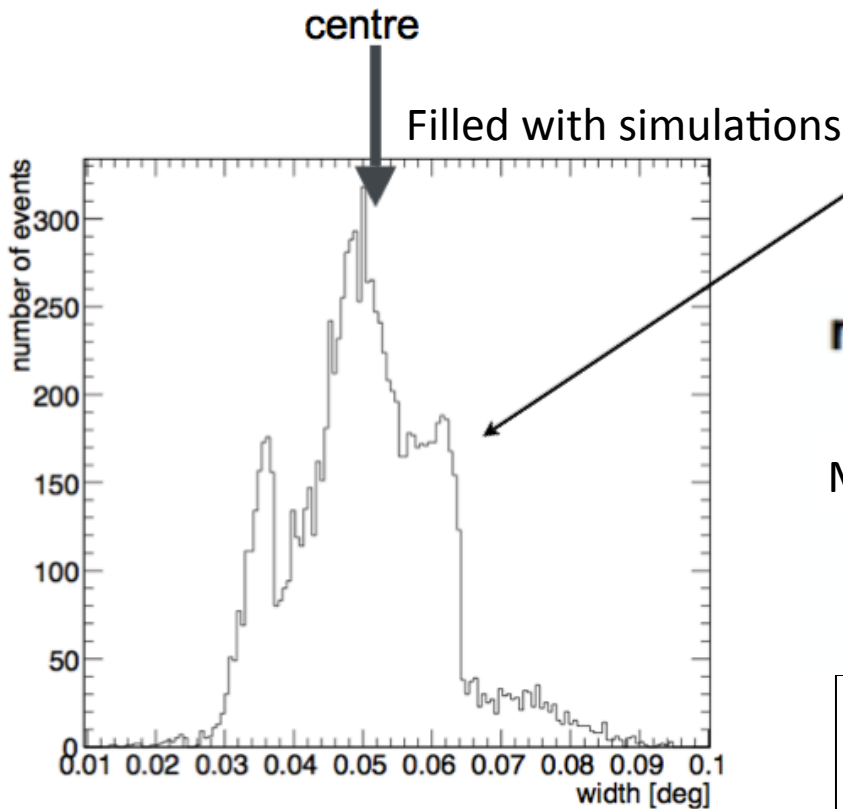


"typical" or average width

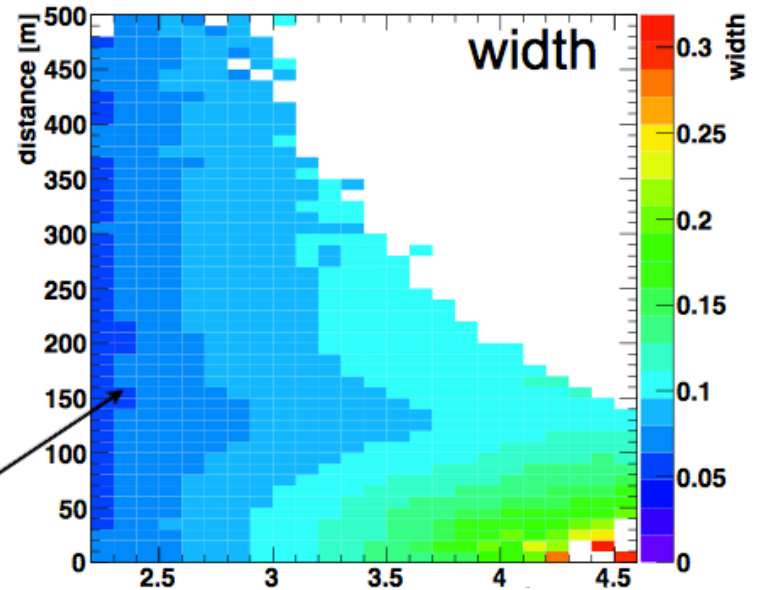


# Lookups

width distribution for a given size, distance, zenith and azimuth angle, noise level and offset from the camera centre



Same concept used for energy reconstruction

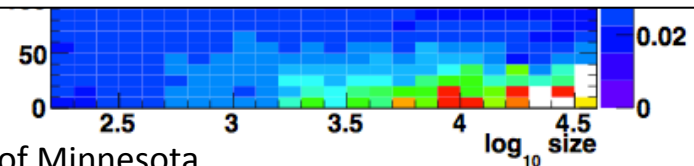


mean scaled width

$$MSW = \frac{1}{N_{images}} \left[ \sum_i^{N_{images}} \frac{width_i}{w_{MC}(R, s, \Theta)} \right]$$

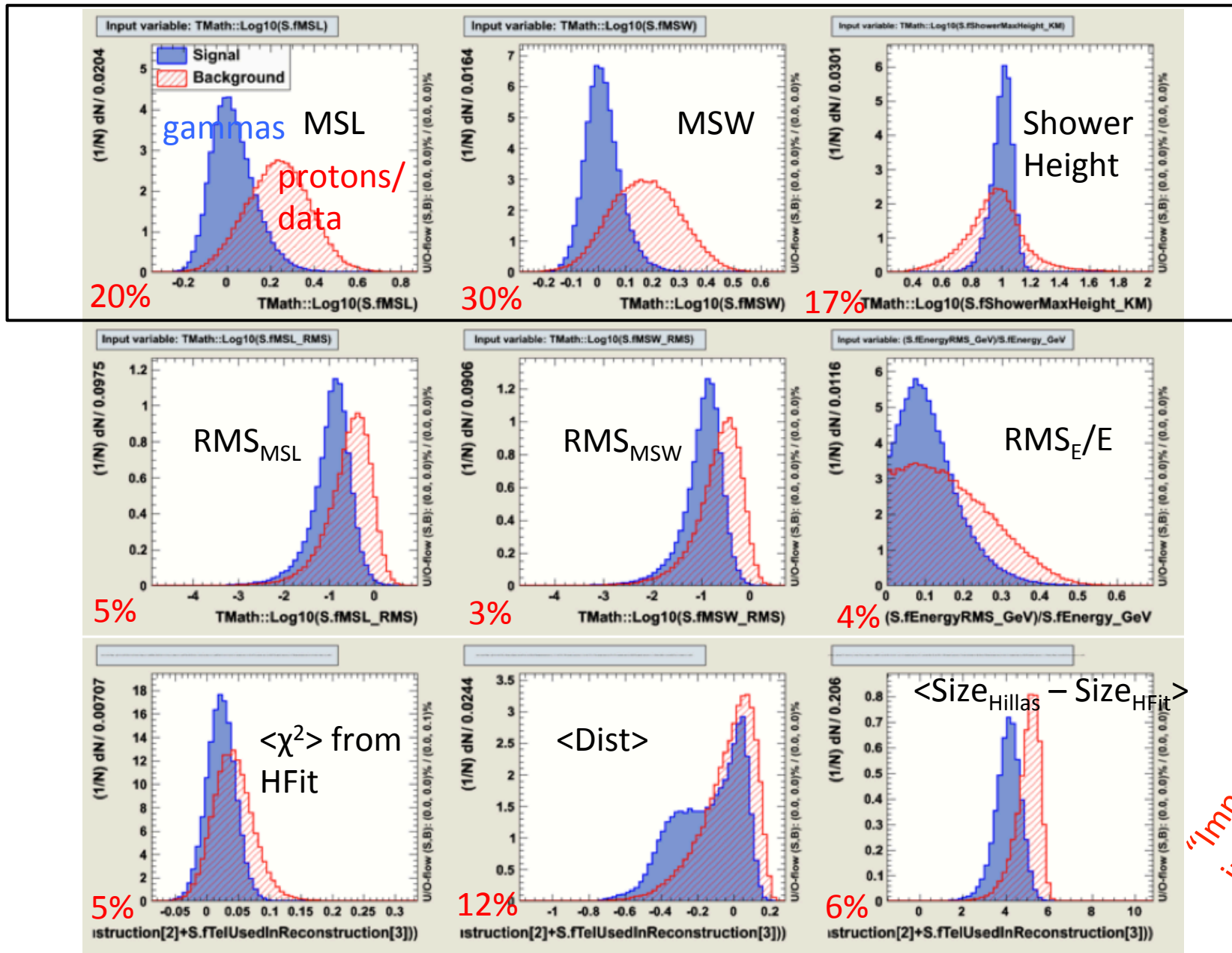
(same for length)

Think of 'mean-scaled' quantities as "wrt a typical gamma-ray shower"





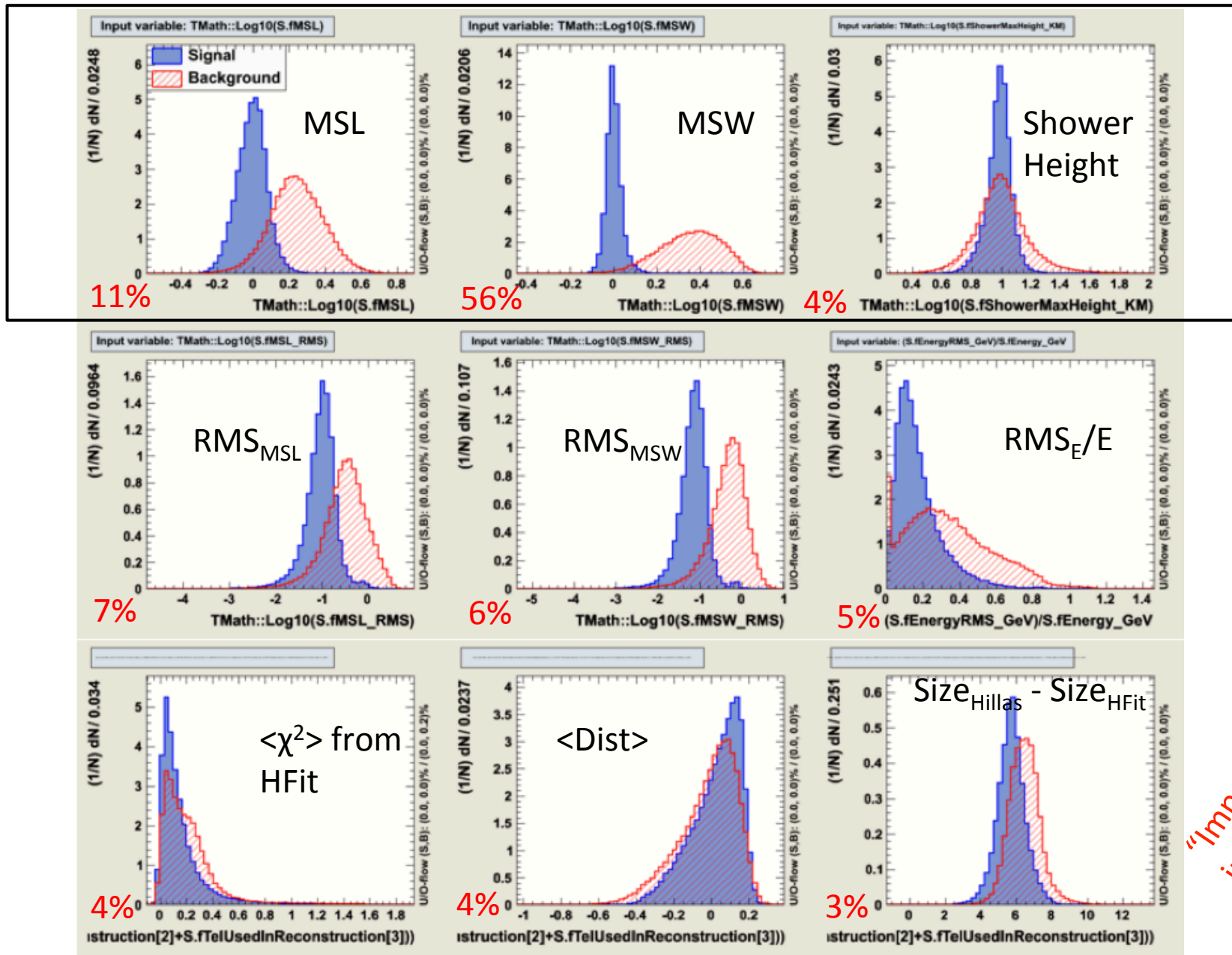
# Useful Parameters, <320 GeV



“Importance”  
in red

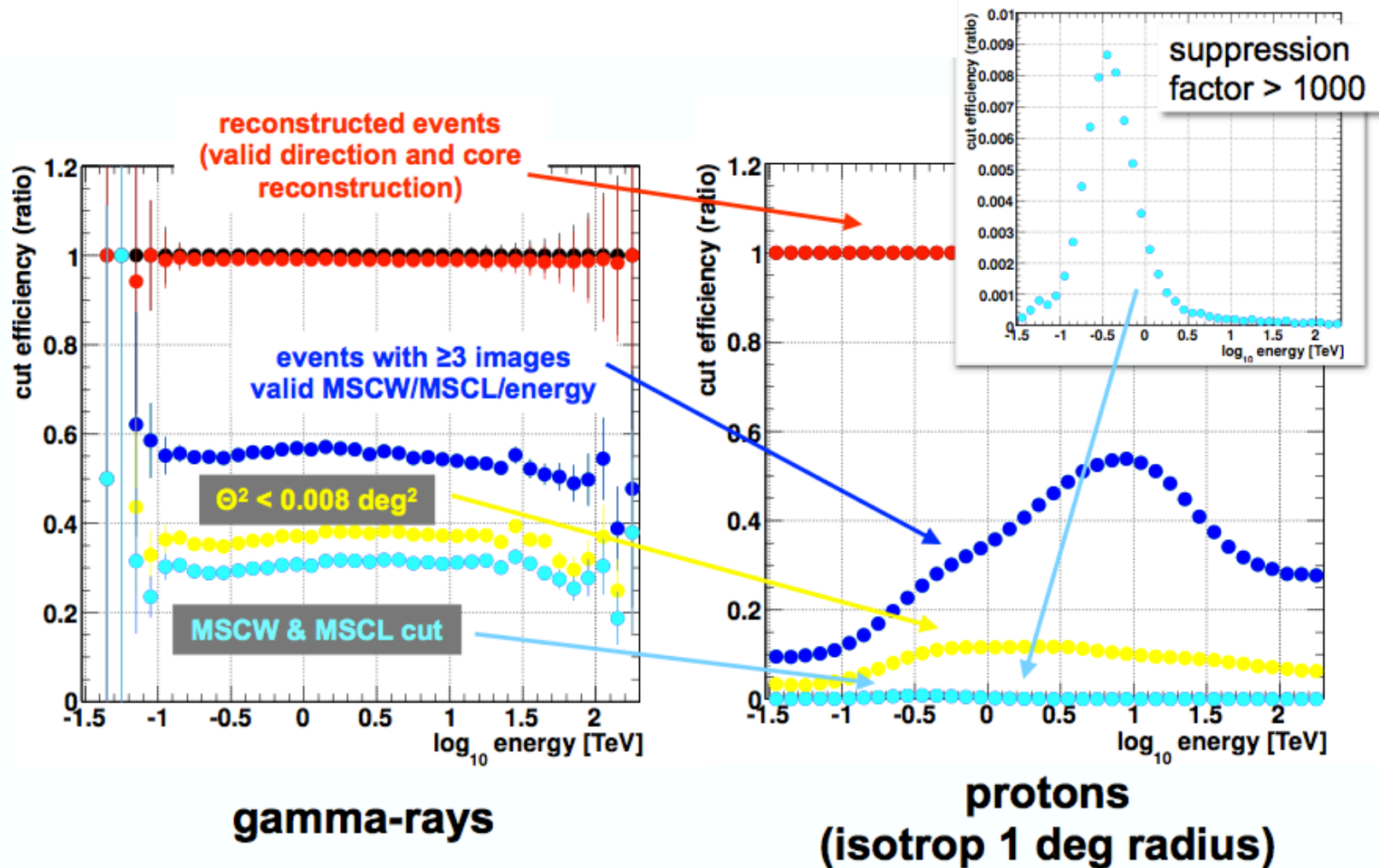


# Useful Parameters, > 1 TeV



“Importance”  
in red

# Gamma/Hadron Separation



# Browsing Gamma-like Events



```
]$ cd ~/VERITAS/CrabAnalysis
```

```
]$ root
```

```
[0] TFile *file = new TFile("59521.stage5.root");
```

```
// Ignore warnings
```

```
[1] TBrowser tb;
```

```
// Navigate: ROOT files -> 59521.stage5.root -> SelectedEvents
```

```
[2] ShowerEventsTree->Draw("fTheta2_Deg2>>h(40,0,0.4)")
```

List of gamma-like events is natural jumping off point for joint analysis!

The essential quantities are:

fDirection[RA/Dec]\_J2000\_Rad and fEnergy\_GeV



# How to Run Everything

- Simple bash script to run a VERITAS analysis

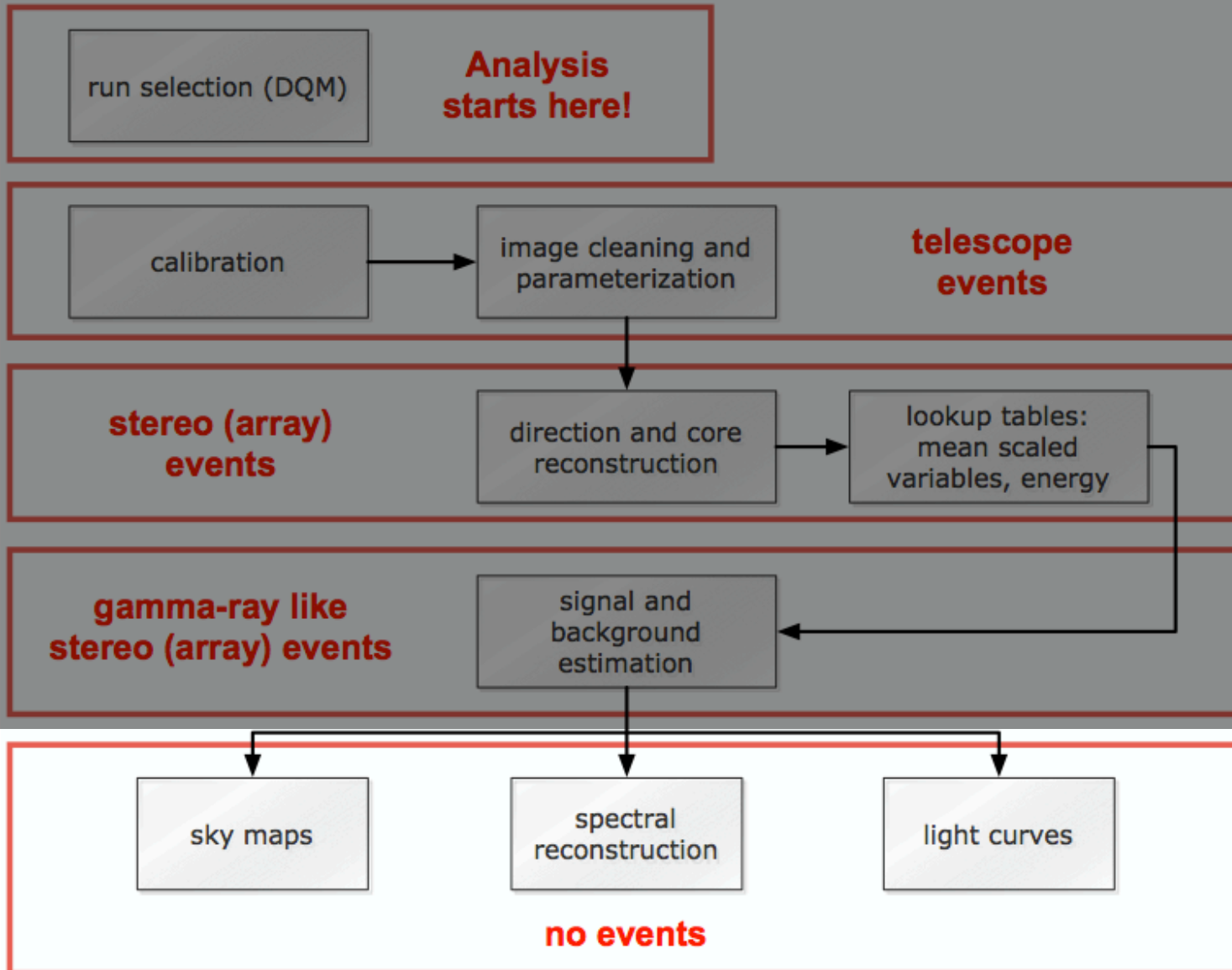
```
]$ cd /home/fermi  
]$ cd VERITAS  
]$ less vegas-vanilla.sh
```

- Decision points:
  - Tel **Size** cut in **stage4**
  - **MSW/L** and **ShowerHeight** cuts in **stage5**

Soft, medium, hard, loose options standardized.  
Today we are running a **soft** analysis



# Analysis Overview





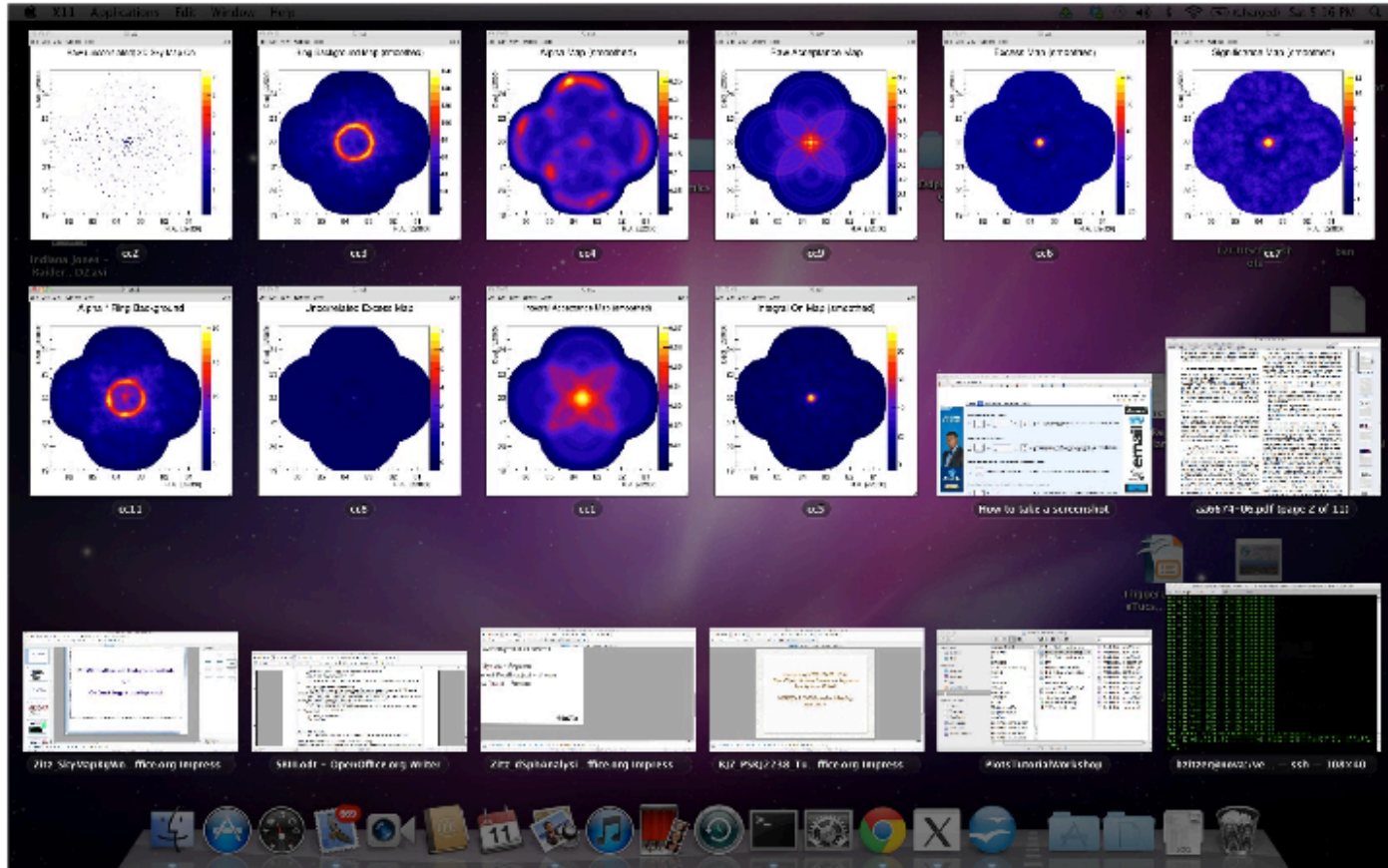
# Results Extractor

---

- Running the final stage is the most user-configurable:

```
]$ cd /home/fermi  
]$ source veritasinit.csh  
]$ cd VERITAS  
  
]$ less stage6.sh  
]$ ./stage6.sh
```





**“VEGAS SkyMaps and Background Methods”**  
**Or:**  
**“Oh Crap! Stage 6 Just Exploded!”**  
**Ben Zitzer – 1/14/14**

# Background Estimation

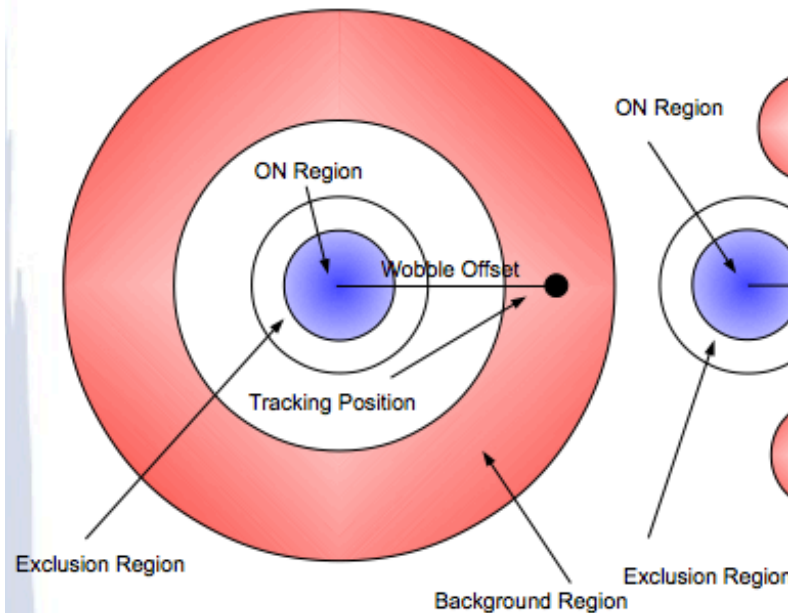


- Even after gamma/hadron separation cuts, we still have hadronic contamination
  - These are the CRs that look like gammas
  - Need to estimate contamination and subtract
- Two main background estimation methods
  - Ring Background Method (RBM)
  - Reflected Region (aka Wobble)
  - (Time very useful for pulsars)

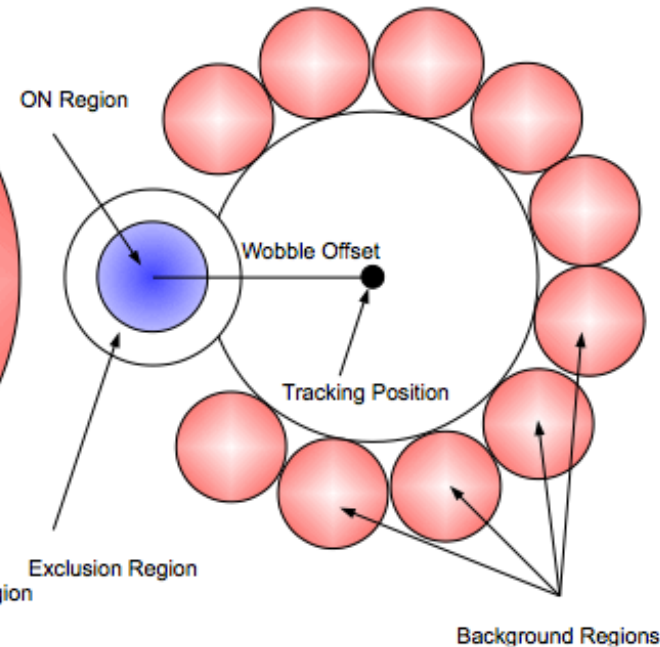


# Background Methods

## Ring Background



## Reflected Regions



**RBM:** Use annulus around source

+Pros: Lots of statistics, great for skymaps/extended sources

-Cons: Not good for spectra, requires acceptance correction

**Reflected Regions:** Uses ON-shaped regions reflected about tracking position

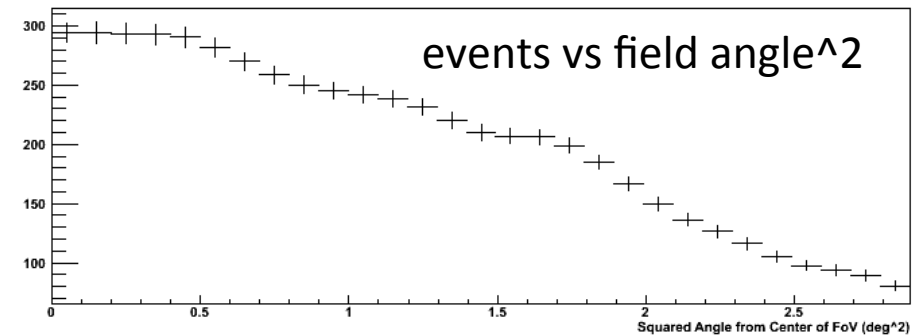
+Pros: Uniform acceptance, great for spectra

-Cons: Less background statistics



# Acceptance

- The probability of accepting a gamma-ray-like event at a position in the field of view

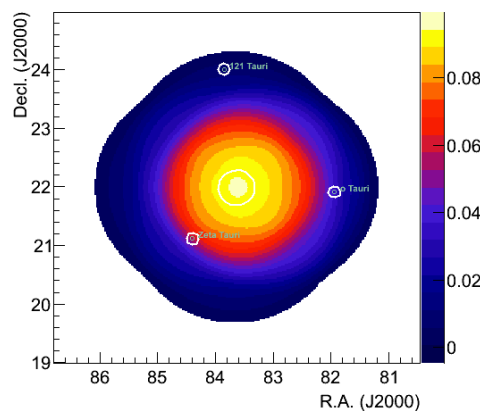


- Alpha: ratio of ON/OFF integral acceptance

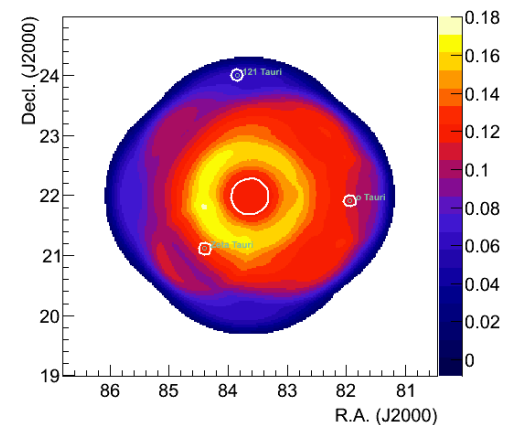
$$\alpha = \frac{\int_{\text{on}} A_{\text{on}}^{\gamma}(\psi_x, \psi_y, \phi_z, E, t) d\psi_x d\psi_y d\phi_z dE dt}{\int_{\text{off}} A_{\text{off}}^{\gamma}(\psi_x, \psi_y, \phi_z, E, t) d\psi_x d\psi_y d\phi_z dE dt}$$

- Both radially symmetric around tracking position

Integral Acceptance Map (smoothed)



Alpha Map (smoothed)



# Significance and Detection

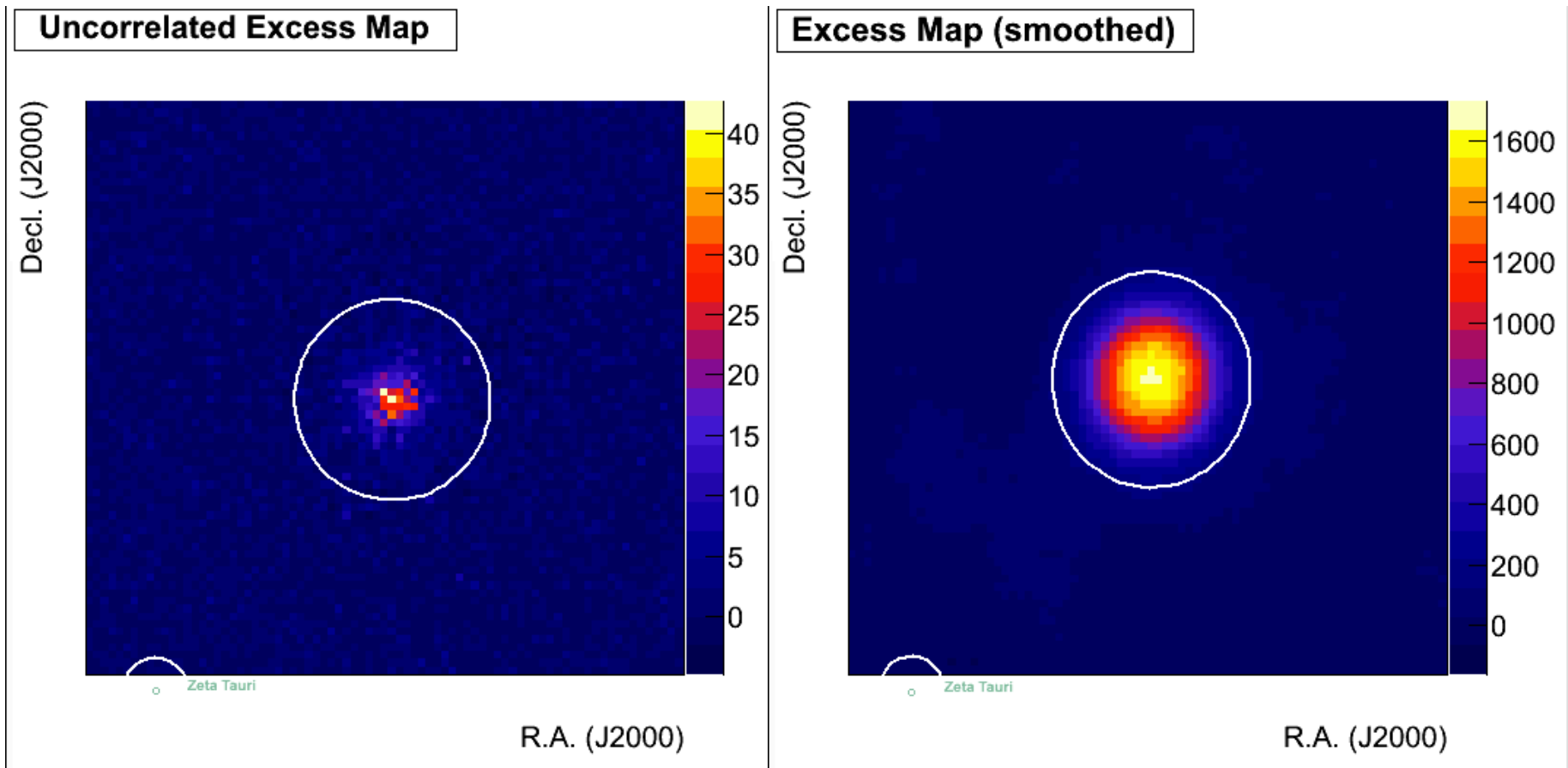


- Significance calc from Li&Ma 1983
  - Binned likelihood ratio test:

$$S = \sqrt{2} \left( N_{on} \ln \left( \frac{1 + \alpha}{\alpha} \left( \frac{N_{on}}{N_{on} + N_{off}} \right) \right) + N_{off} \ln \left( (1 + \alpha) \frac{N_{off}}{N_{off} + N_{on}} \right) \right)^{1/2}$$

- 5  $\sigma$  required for claim of detection
  - After taking into account the Look Elsewhere Effect (i.e. trials)

# Smoothing Using Circ Aperture

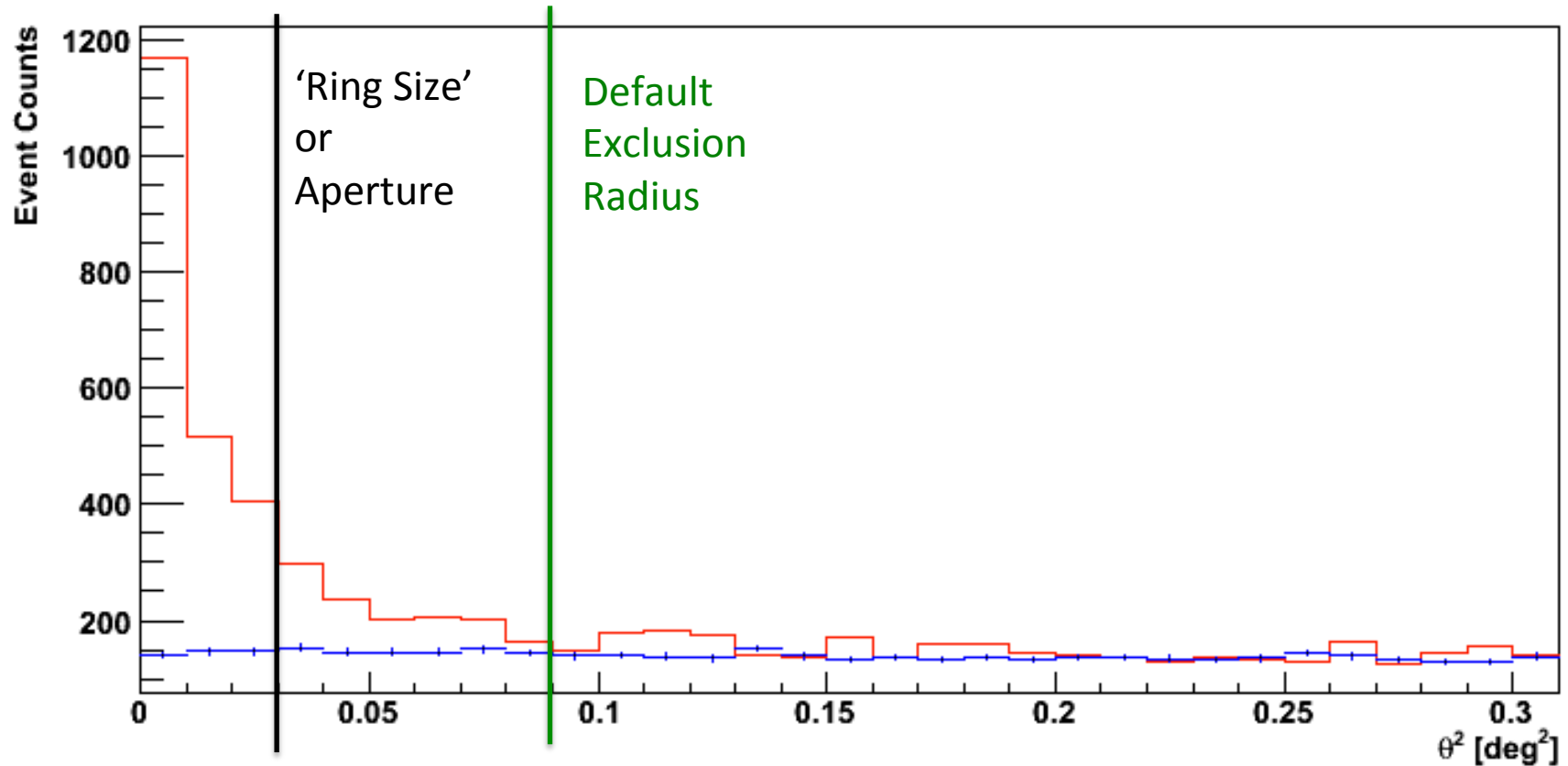






# Theta<sup>2</sup> Plot (PSF)

Theta square plot (Wobble)

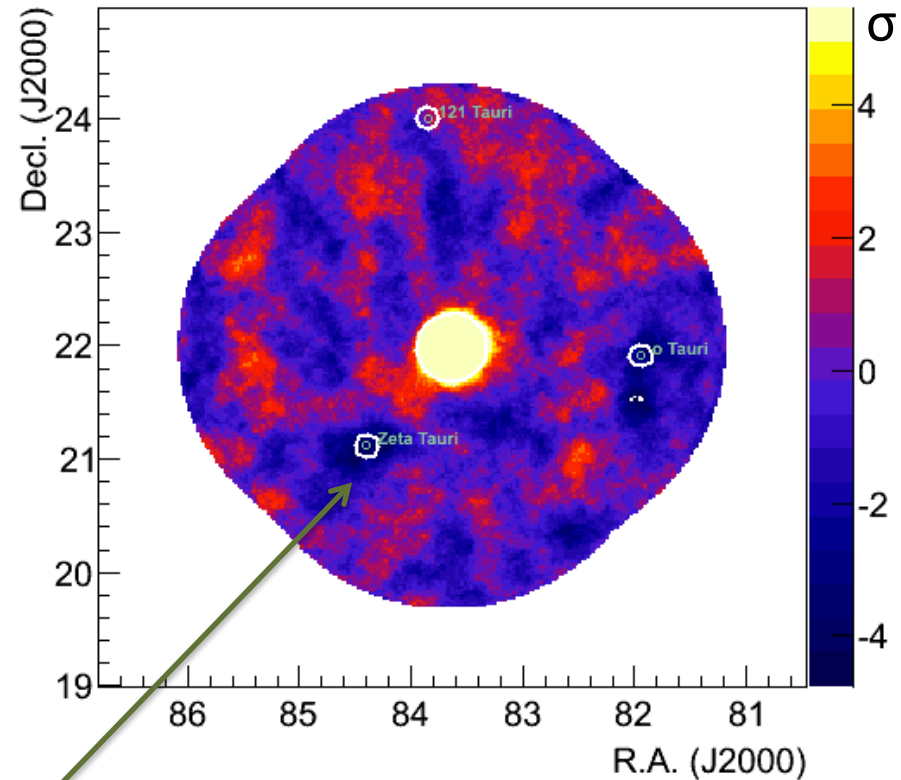
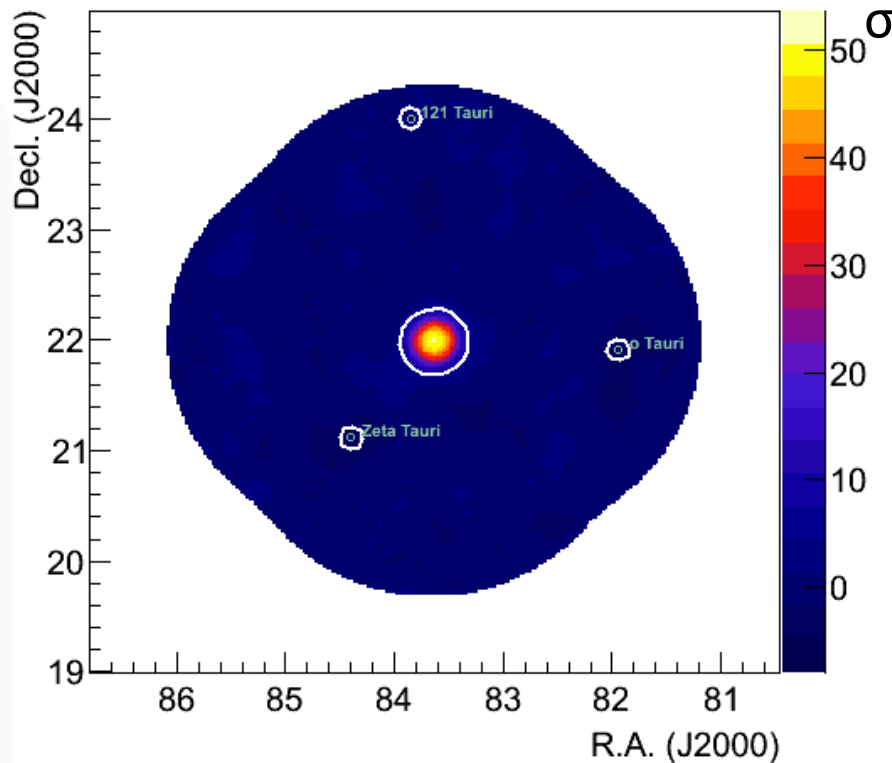




# Significance Distribution

Significance Map (smoothed)

Significance Map (smoothed)



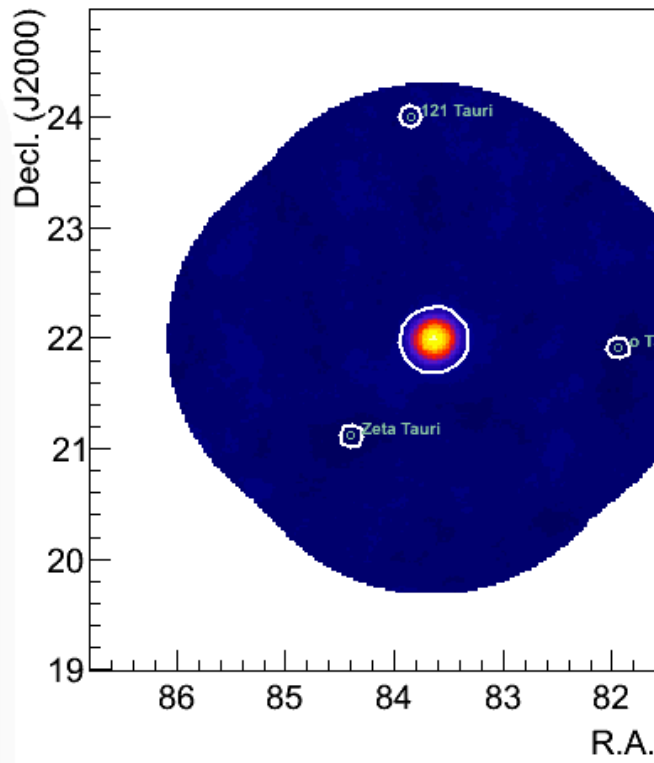
Same plot; scale zoomed!

This is a 'soft' analysis:  
Size > 200 susceptible to 'star bias.'  
Negative sig. near stars needs to be excluded.

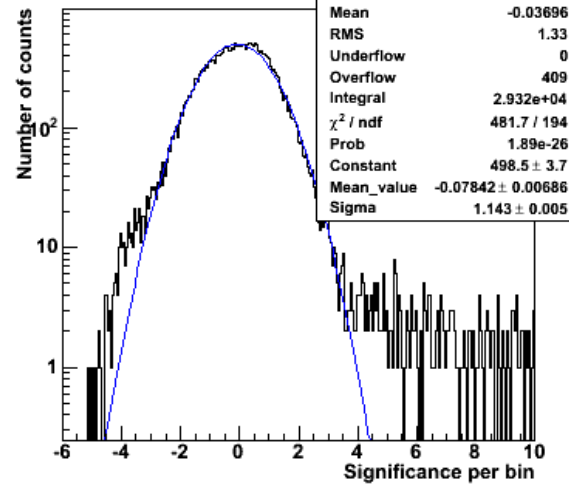


# Significance Distribution

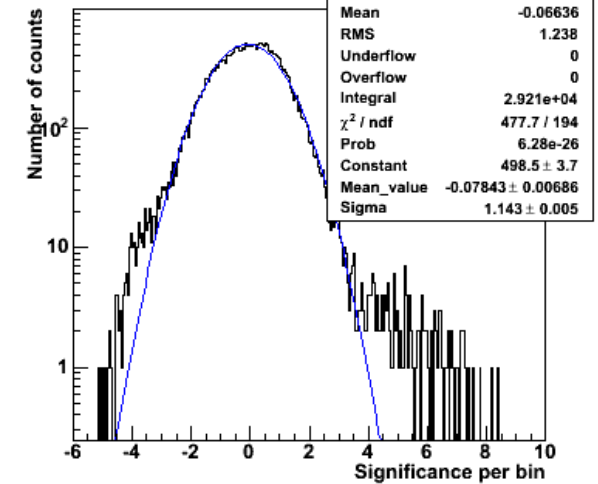
Significance Map (smoothed)



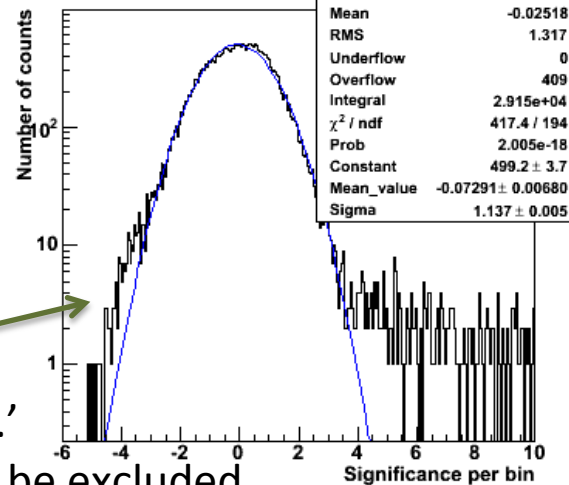
Sign Distr for All Bins



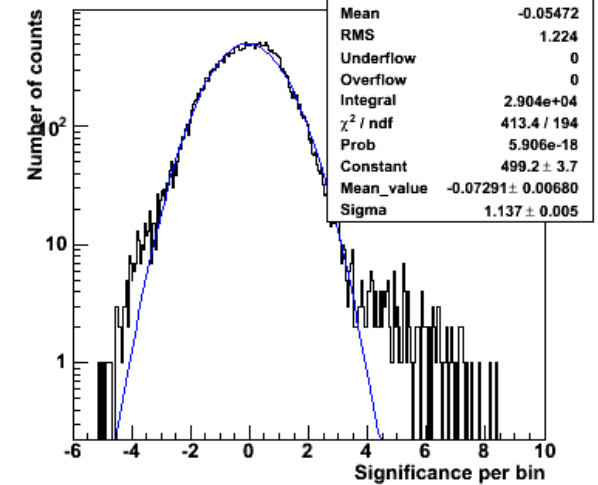
Sign Distr Minus Source Exclusion



Sign Distr Minus Star Exclusions



Sign Distr Minus All Exclusions

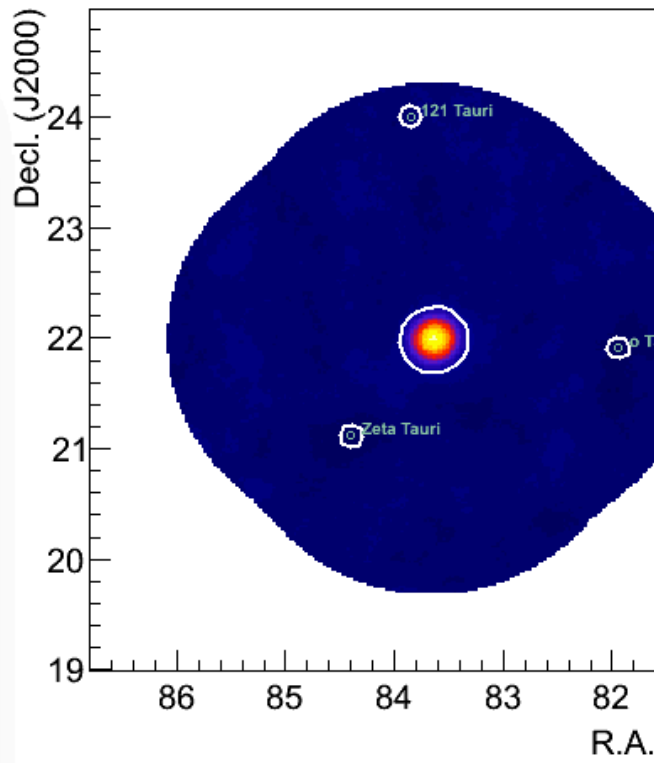


This is a 'soft' analysis:  
 Size > 200 susceptible to 'star bias.'  
 Negative sig. near stars needs to be excluded.

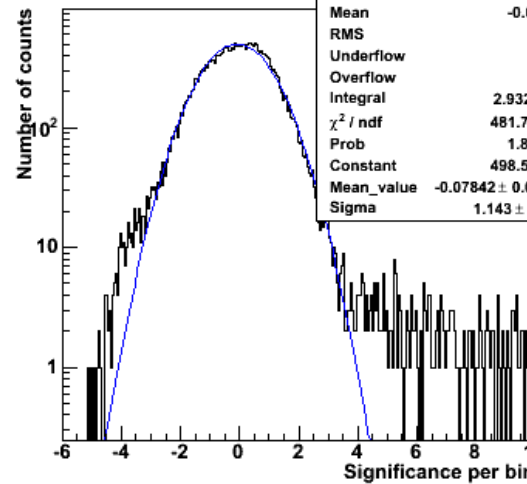


# Significance Distribution

Significance Map (smoothed)

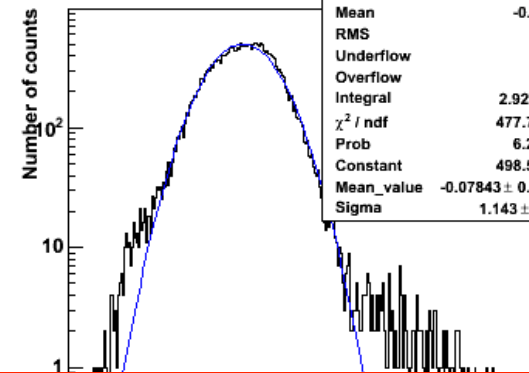


Sign Distr for All Bins



SigDistributionAllBins	
Entries	29731
Mean	-0.03696
RMS	1.33
Underflow	0
Overflow	409
Integral	2.932e+04
$\chi^2 / \text{ndf}$	481.7 / 194
Prob	1.89e-26
Constant	498.5 ± 3.7
Mean_value	-0.07842 ± 0.00686
Sigma	1.143 ± 0.005

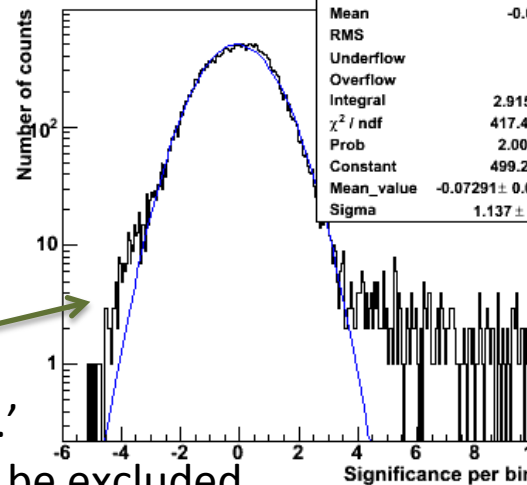
Sign Distr Minus Source Exclusion



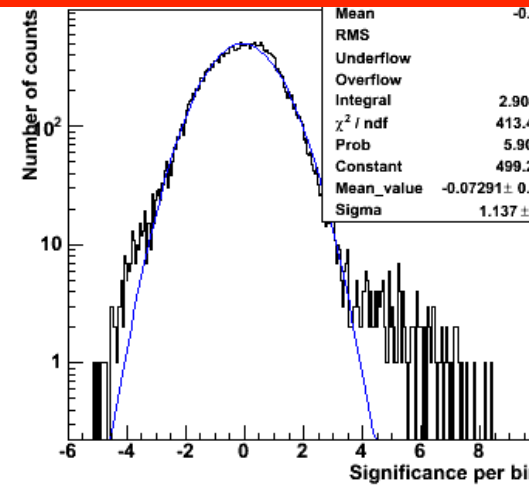
Sign Distr Minus Source Exclusion	
Entries	29214
Mean	-0.06636
RMS	1.238
Underflow	0
Overflow	0
Integral	2.921e+04
$\chi^2 / \text{ndf}$	477.7 / 194
Prob	6.28e-26
Constant	498.5 ± 3.7
Mean_value	-0.07843 ± 0.00686
Sigma	1.143 ± 0.005

Non-Gaussian significance distribution not acceptable: Let's fix them up!

Sign Distr Minus Star Exclusions



Sign Distr Minus Star Exclusions	
Entries	29214
Mean	-0.02518
RMS	1.317
Underflow	0
Overflow	409
Integral	2.915e+04
$\chi^2 / \text{ndf}$	417.4 / 194
Prob	2.005e-18
Constant	499.2 ± 3.7
Mean_value	-0.07291 ± 0.00680
Sigma	1.137 ± 0.005



Sign Distr Minus Star Exclusions	
Entries	29214
Mean	-0.05472
RMS	1.224
Underflow	0
Overflow	0
Integral	2.904e+04
$\chi^2 / \text{ndf}$	413.4 / 194
Prob	5.906e-18
Constant	499.2 ± 3.7
Mean_value	-0.07291 ± 0.00680
Sigma	1.137 ± 0.005

This is a 'soft' analysis:  
 Size > 200 susceptible to 'star bias.'  
 Negative sig. near stars needs to be excluded.

# Techniques to Fix Sky Map



- Most important stage6 options in stage6.sh:

```
-S6A_SourceExclusionRadius=0.3  
-S6A_StarExclusionBMagLimit=5  
-S6A_StarExclusionRadius=0.1
```

- ← Increase for bright sources
- ← Increase to exclude dimmer stars
- ← Increase if star bias large

- For full help text on each option:

```
vaStage6 -help=full | less
```

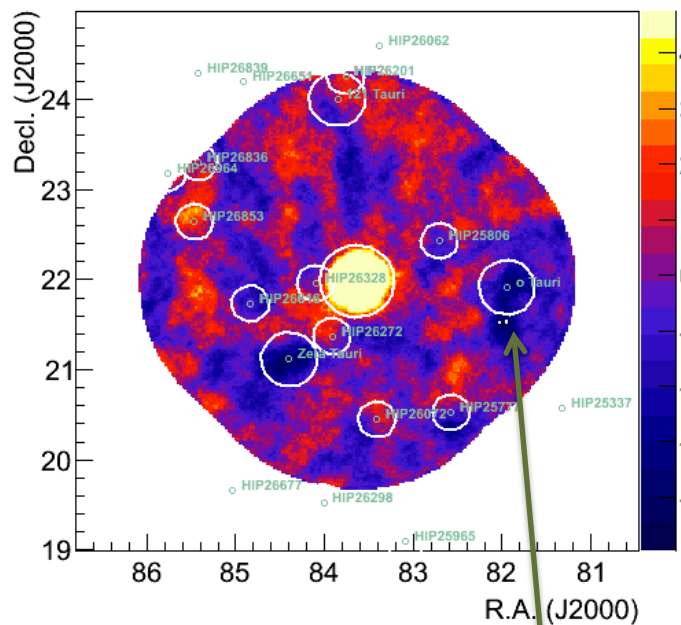
- Rerun the stage6.sh wrapper with tweaked options to clean up background estimates

```
nano stage6.sh  
./stage6.sh
```



# Significance Distribution

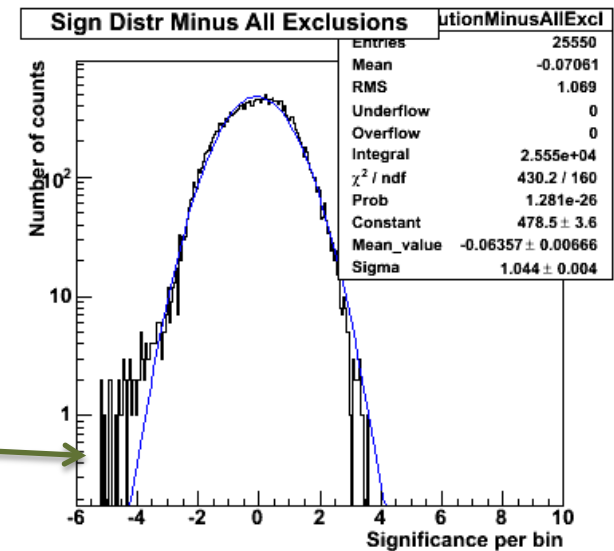
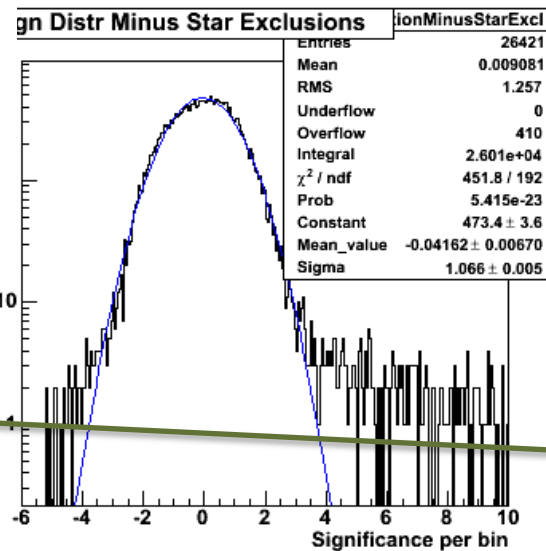
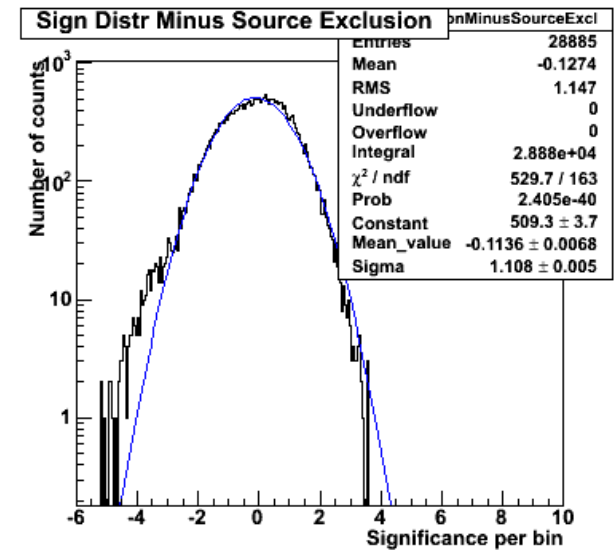
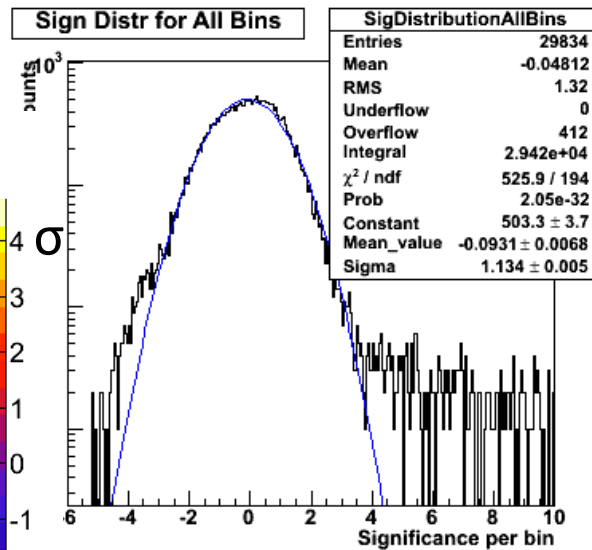
Significance Map (smoothed)



check out:

[.stage6.sh.answerkey](https://stage6.sh.answerkey)

Still some more cleanup  
could be done – few dim stars

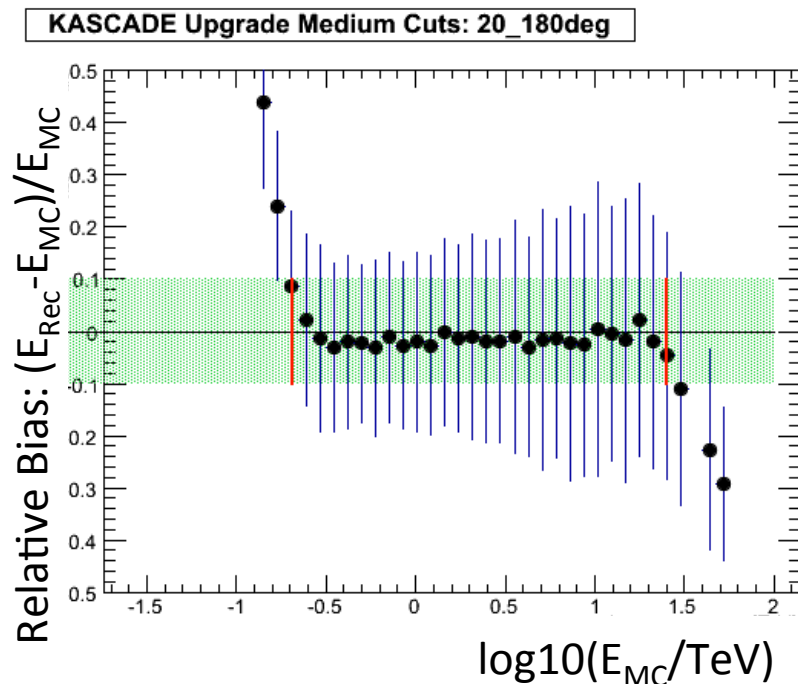




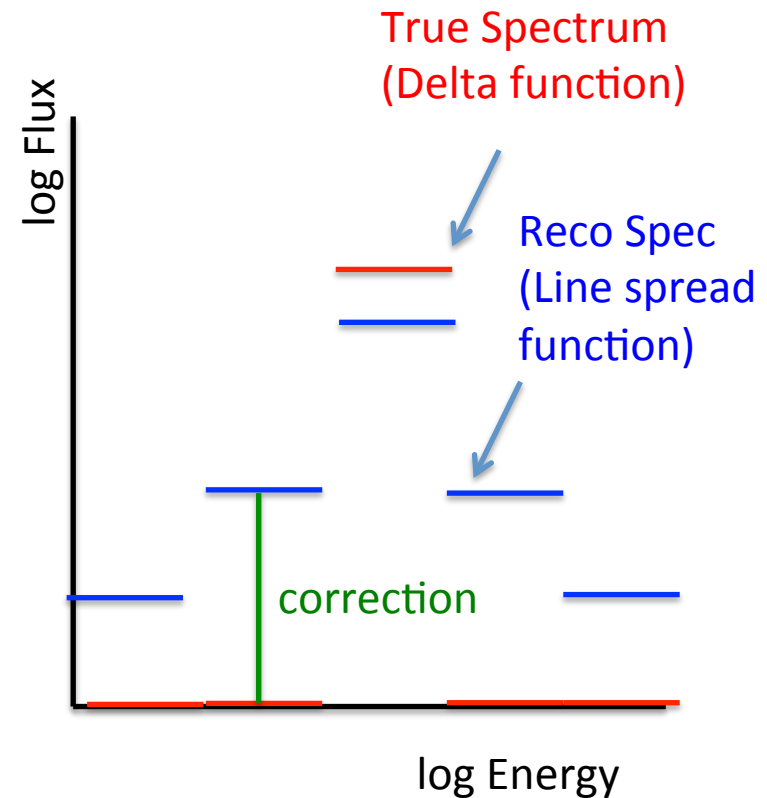


# Spectral Reconstruction

- Why is it difficult?
  - non-zero Energy resolution:



Energy Resolution Curve

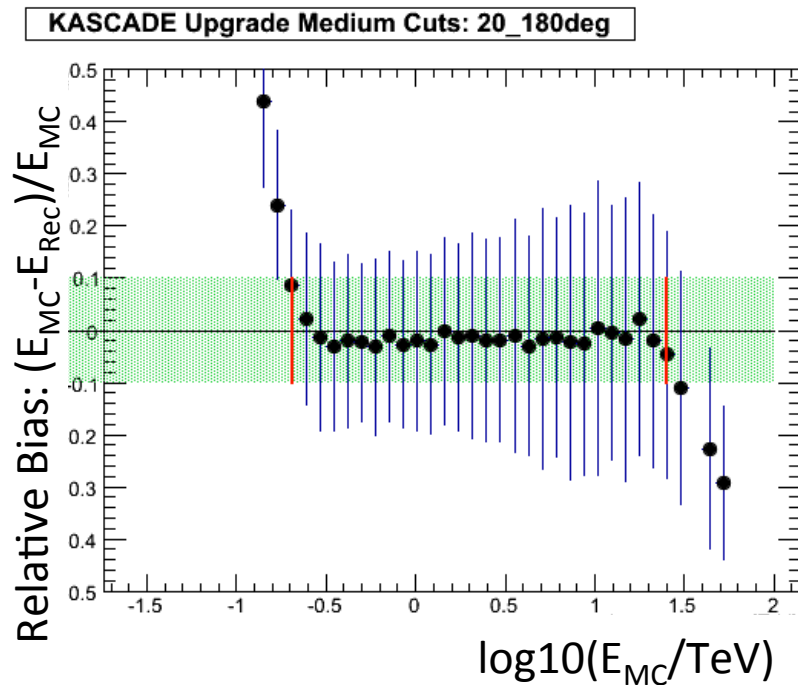


If you know true spectrum and energy resolution, one can subtract off 'cross talk' to obtain true flux

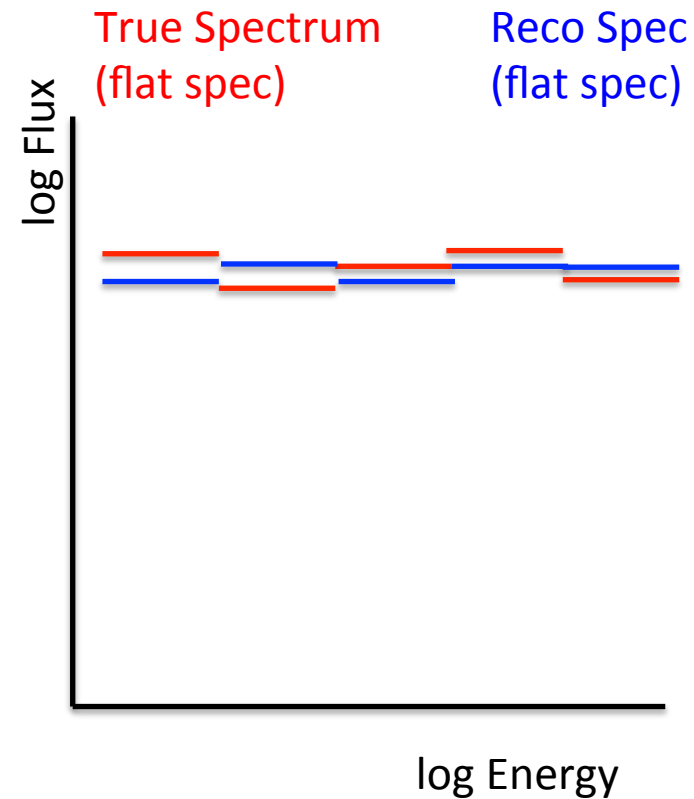
# Spectral Reconstruction



- Why is it difficult?
  - non-zero Energy resolution:



Energy Resolution Curve

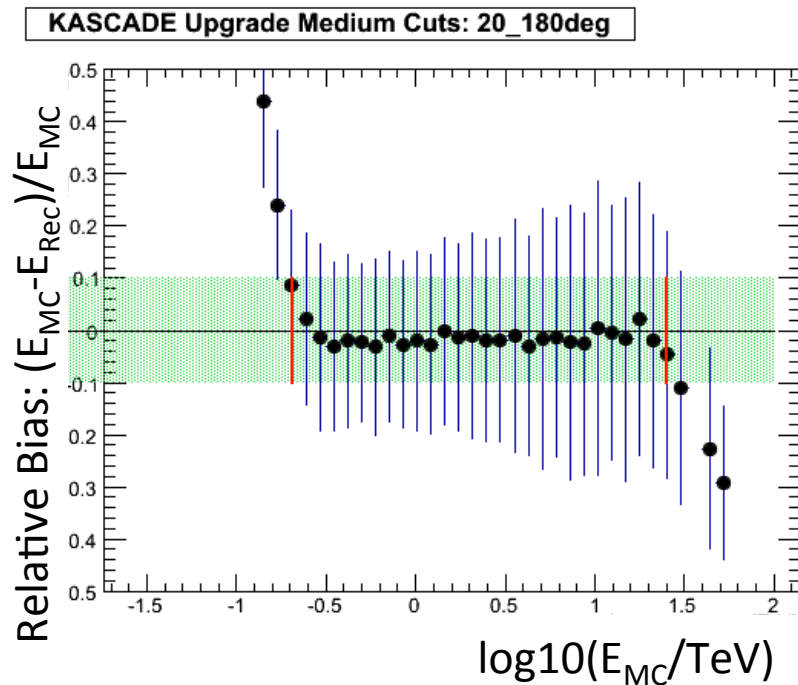


Only small corrections for flat spectra

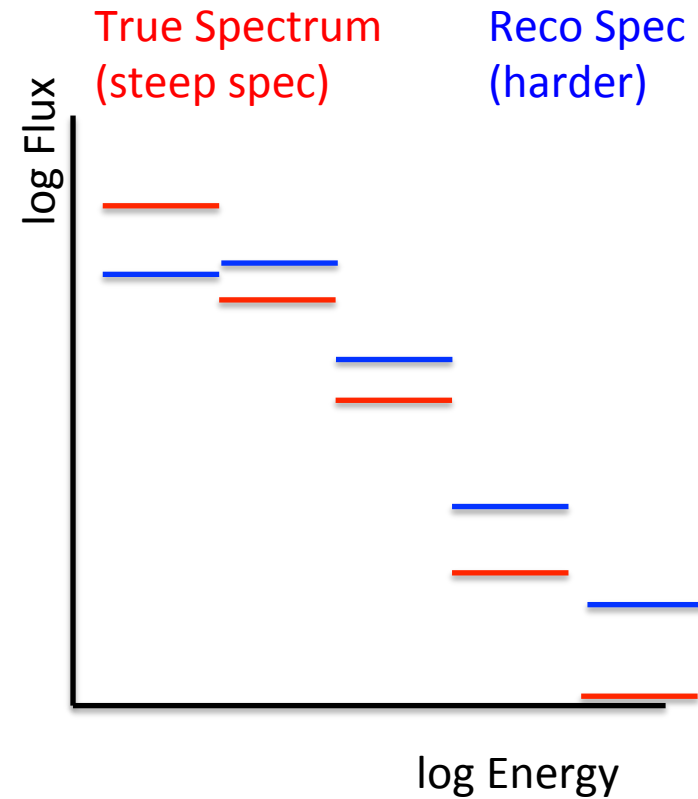
# Spectral Reconstruction



- Why is it difficult?
  - non-zero Energy resolution:



Energy Resolution Curve



Larger corrections for steep spectra



# Spectral Reconstruction

number of observed events in energy bin  $E_j$

observing interval

gamma-ray source spectrum

“Modified” Effective Area

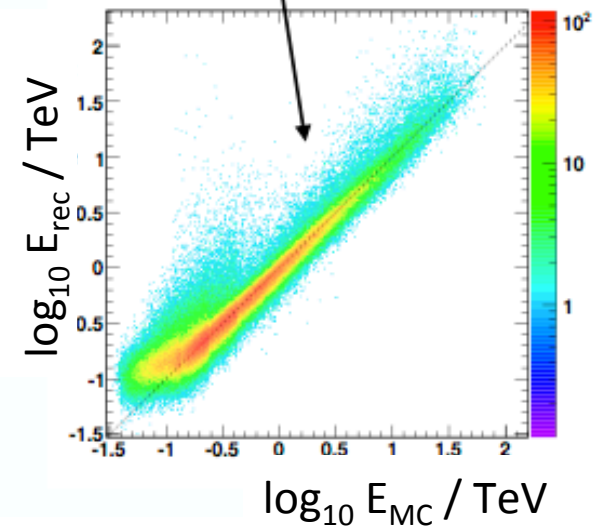
detector uptime

probability of measuring  $E^{rec}$

$$N_{obs}(E_j^{rec}) = \int_{t_0}^{t_1} dt \int_0^{\infty} dE \frac{dN_{\gamma}}{dE dA dt} A_0 \times p(E_j^{rec} | E) \times \epsilon(t)$$

Goal is to reconstruct the gamma-ray source spectrum: invert this integral

Bin correction method as rudimentary unfolding



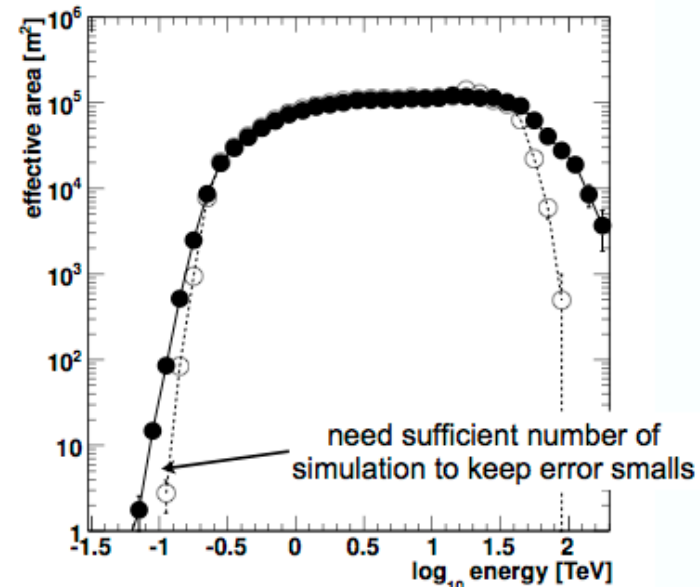
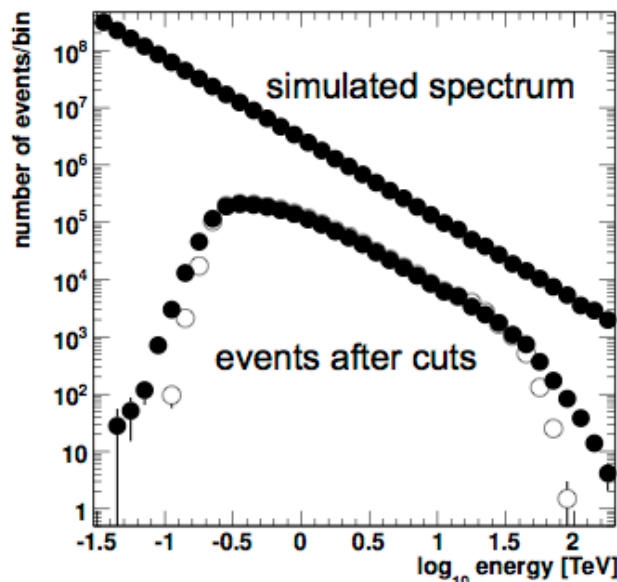
G.Mohanty et al, Astroparticle Physics 9, 15 (1998)  
 J.Albert et al, NIM A 583, 494 (2007)  
 Many textbooks, e.g. Cowan: Statistical Data Analysis, Oxford (1998)



# Effective Area

$$A(E) = A_0 \left( \frac{\text{number passing selection at } E}{\text{number simulated at } E} \right)$$

$A_0$ : sufficiently large throw area of MC events



Filled circles: True Energy  
Open circles: Reco Energy -> Modified Eff Area



# Correction Method

- Inverting our integral eqn to solve for flux:

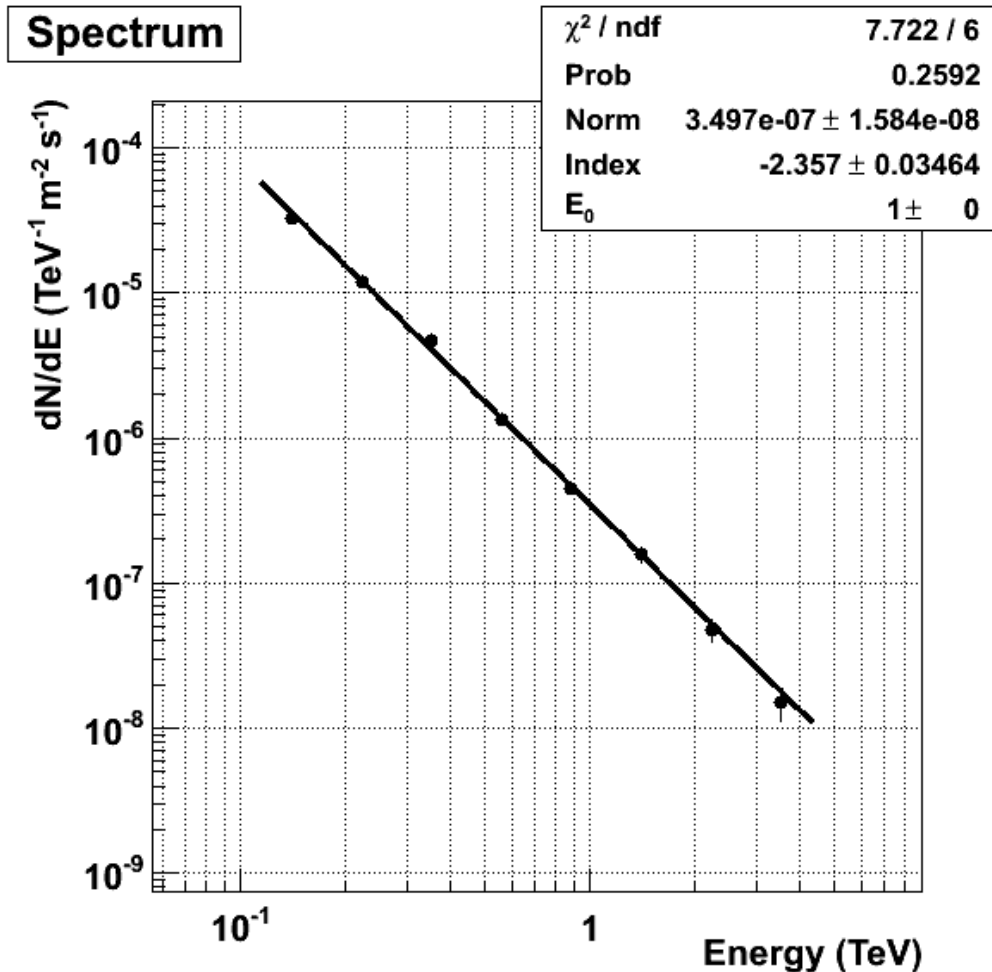
$$\frac{dF_i}{dE} = (T \Delta E_i)^{-1} \cdot \left( \sum_{j=0}^{N_{\text{on}}} (A_{\text{reco}_j})^{-1} - \alpha \sum_{k=0}^{N_{\text{off}}} (A_{\text{reco}_k})^{-1} \right)$$

- Mod. Eff. Area ( $A_{\text{reco}}$ ) depends on true spectrum
  - Results biased towards hypothesis spectrum
  - Iterate (by hand) until results look like hypothesis
    - Trivial for power laws
- Variance scales like bin cross-talk squared
  - Keep bins larger than energy resolution





# Final Remarks on Spectra



- Energy threshold determined by:
  - Max differential counts
  - Max rel. uncertainty in Eff Area
  - Max energy bias
- Bin requirements by default:
  - $2 \sigma$  in VEGAS;  $3 \sigma$  in ED
  - $\geq 5$  excess counts
- Thresholding possibly biases end points of spectra



# Conclusions

---

- VERITAS has two mature standard analysis packages
  - Interested in VERITAS data? Need to partner with VERITAS member
  - Exploring more public tools
    - Expansion of existing internal tools (nextday analysis)
- Lots of improvements compared to what I showed today are in the pipeline
  - Image/shower template fitting
  - Machine learning event selection (BDTs)
  - Spectral unfolding techniques
  - Unbinned maximum likelihood source fitting