

## Fermi-LAT likelihood analysis (2)

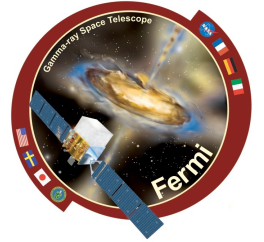
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on behalf of the *Fermi*-LAT collaboration

Credits for the likelihood talks:  
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Benoit Lott

## gtfindsrc



Optimizes a point source location using the likelihood test-statistic

```
/COSPAR < 66 >gtfindsrc  
Event file[3c454_100_300000_evt02.fits]  
Spacecraft file[L090923112502E0D2F37E71_SC00.fits]  
Output file for trial points[out_findsrc]  
Response functions to use[P6_V3_DIFFUSE]  
Livetime cube file[3c454_expcube.fits]  
Unbinned exposure map[3c454_expmap.fits]  
Source model file[3c454_srcmdl.xml]  
Building source model from 3c454_srcmdl.xml  
-log-likelihood of input source model: 326013  
Target source name[3c454] _3c454  
Optimizer (DRMNFB|NEWMINUIT|MINUIT|DRMNGB|LBFGS) [MINUIT]  
Tolerance for -log(Likelihood) at each trial point[0.01]  
Convergence tolerance for positional fit[0.01]  
Best fit position: 343.517, 16.1597  
Error circle radius: 0.0175704
```



**Generate photon events from astrophysical sources and process those photons according to the specified instrument response functions**

**/obs < 161 >gtobssim**

File of flux-style source definitions[obsSim\_source\_library.xml]

File containing list of source names[source\_names.dat]

Pointing history file[./L090923112502E0D2F37E71\_SC00.fits]

Prefix for output files[sim]

Simulation time (seconds)[86400]

Simulation start date[2009-07-02 00:00:00]

Apply acceptance cone?[yes]

RA of cone center (degrees) (-360:360) [343.5]

Dec of cone center (degrees) (-90:90) [16.15]

Acceptance cone radius (degrees) (0:180) [20]

Response functions[P6\_V3\_DIFFUSE]

Random number seed[293049]

added source "Extragalactic\_diffuse"

added source "Galactic\_diffuse"

added source "\_3c454"

Generating events for a simulation time of 86400 seconds....

Warning: 268188711 seems to be in an invalid interval: it is 67.1292 seconds beyond the start of the current FT2 entry

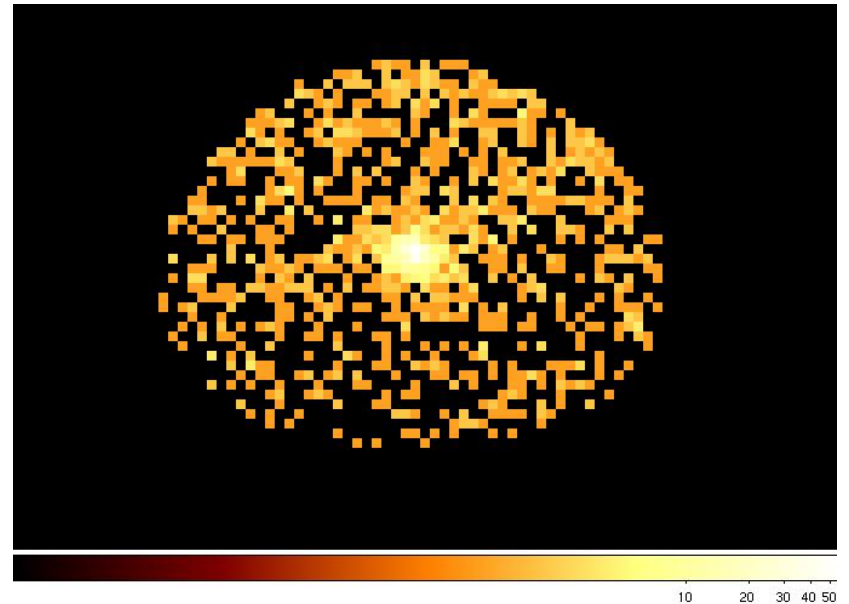
-----

Warning: 268188711 seems to be in an invalid interval: it is 67.36 seconds beyond the start of the current FT2 entry

Done.

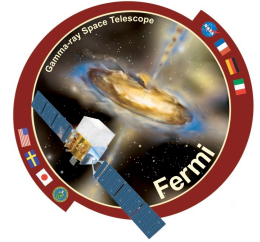
132.096u 5.238s 2:29.17 92.0% 0+0k 0+0io 0pf+0w

/obs < 162 >



**Photon file is sim\_events\_0000.fits**

## gtobssim (2)



```
/obs < 82 >more_obsSim_source_library.xml
```

```
<!-- $Header -->
```

```
<source_library title="Source Library">
```

```
<source name="Galactic_diffuse">
```

```
<spectrum escale="MeV">
```

```
<SpectrumClass name="MapCube" params="25,.../gll_iem_v02.fit"/>
```

```
<use_spectrum frame="galaxy"/>
```

```
</spectrum>
```

```
</source>
```

```
<source name="Extragalactic_diffuse">
```

```
<spectrum escale="MeV">
```

```
<SpectrumClass name="Isotropic"
```

```
params="flux=10.7,gamma=2.1,emin=20.,emax=2e5,ra=0,dec=0,radius=180"/>
```

```
<use_spectrum frame="galaxy"/>
```

```
</spectrum>
```

```
</source>
```

```
<source name="_3c454" flux="0.0980184334659">
```

```
<spectrum escale="MeV">
```

```
<particle name="gamma">
```

```
<power_law emin="100.0" emax="1000000.0" gamma="2.46"/>
```

```
</particle>
```

```
<celestial_dir ra="343.5" dec="16.5"/>
```

```
</spectrum>
```

```
</source>
```

```
</source_library>
```

```
/obs < 83 >more_source_names.dat
```

```
Extragalactic_diffuse
```

```
Galactic_diffuse
```

```
_3c454
```

## Plotting results



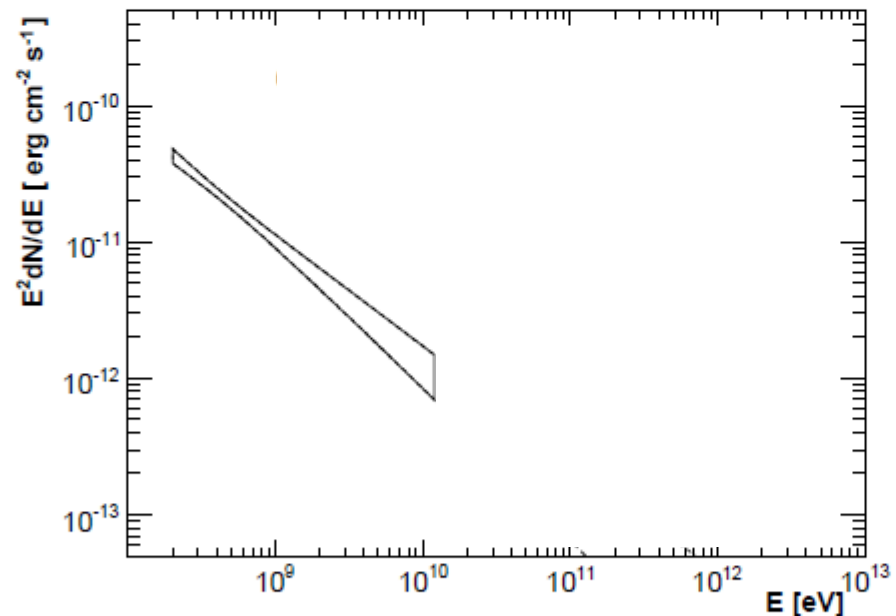
Assuming a power law model:  $F(E) = dN/dE = F_0(E/E_0)^{-\Gamma}$   
 The uncertainty on F at a given energy E is:

$$\frac{\Delta F^2}{F^2} = \frac{\Delta F_0^2}{F_0^2} - \frac{2 \text{cov}(F_0, \Gamma)}{F_0} \log\left(\frac{E}{E_0}\right) + \Delta\Gamma^2 \log^2\left(\frac{E}{E_0}\right)$$

which is minimum at:  $E_d = E_0 \exp[\text{cov}(F_0, \Gamma)/F_0 \Delta\Gamma^2]$

The cross term of the covariance matrix must be obtained using python....

Beware of the maximum energy:  
 the maximum energy of photons potentially coming from the source (small ROI) is an option.



# covariance matrix



**Final values:**

Normalizat = 0.615683  
 Integral = 1.57847  
 Index = 2.32047  
 Integral = 0.434516  
 Index = 2.21215  
 Integral = 1.57868  
 Index = 3.15148  
 Prefactor = 1.29008

gtlike display output

Prefactor = 0.0235878  
 Index = 2.5075

parameters for source of interest

Minuit fit quality: 3 estimated distance: 0.0001474

Minuit parameter uncertainties:

1 0.0453642  
 2 0.154493  
 3 0.0684055  
 4 0.122061  
 5 0.151336  
 6 0.20743  
 7 0.148624  
 8 0.0425466  
 9 0.000754517  
 10 0.0205287

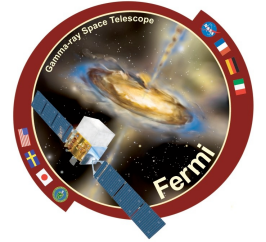
$\Delta F_0$   
 $\Delta \Gamma$

EXTERNAL ERROR MATRIX. NDIM= 10 NPAR= 10 ERR DEF= .500

.206E-02	-.478E-03	-.219E-03	-.526E-03	-.586E-03	-.205E-02	-.737E-03	-.184E-02	-.444E-05	-.100E-03
-.478E-03	.239E-01	.737E-02	.253E-03	.215E-03	.988E-03	.194E-03	.140E-03	.158E-05	.172E-04
-.219E-03	.737E-02	.468E-02	.672E-04	.590E-04	.338E-03	.835E-04	.128E-03	.465E-06	.637E-05
-.526E-03	.253E-03	.672E-04	.149E-01	.151E-01	.907E-03	.224E-03	.281E-03	-.876E-05	-.150E-03
-.586E-03	.215E-03	.590E-04	.151E-01	.229E-01	.927E-03	.244E-03	.358E-03	-.948E-05	-.166E-03
-.205E-02	.988E-03	.338E-03	.907E-03	.927E-03	.430E-01	.176E-01	.152E-02	.213E-05	.346E-04
-.737E-03	.194E-03	.835E-04	.224E-03	.244E-03	.176E-01	.221E-01	.643E-03	-.239E-06	-.354E-05
-.184E-02	.140E-03	.128E-03	.281E-03	.358E-03	.152E-02	.643E-03	.181E-02	.297E-05	.797E-04
-.444E-05	.158E-05	.465E-06	-.876E-05	-.948E-05	.213E-05	-.239E-06	.297E-05	.569E-06	.129E-04
-.100E-03	.172E-04	.637E-05	-.150E-03	-.166E-03	.346E-04	-.354E-05	.797E-04	.129E-04	.421E-03

## Upper limits

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Some analysis results may be not statistically significant,  $TS < TS_{\text{thresh}}$ . Typically,  $TS_{\text{thresh}} = 25$  but it can be lower for some purposes.

The resulting flux should then not be considered as the real source flux.

An upper limit associated with a given confidence level (90% in the following) has then to be reported.

Ex: Catalog, light curves...

# Profile Likelihood Intervals



meas  $n$ ,  
meas.  $b$

ML of  $b$  given  $s$

$$\lambda(s) = \frac{\mathcal{L}(n, b_m | s, \hat{b}(s))}{\mathcal{L}(n, b_m | \hat{s}, \hat{b})}$$

ML of  $b$  and  $s$   
given observations

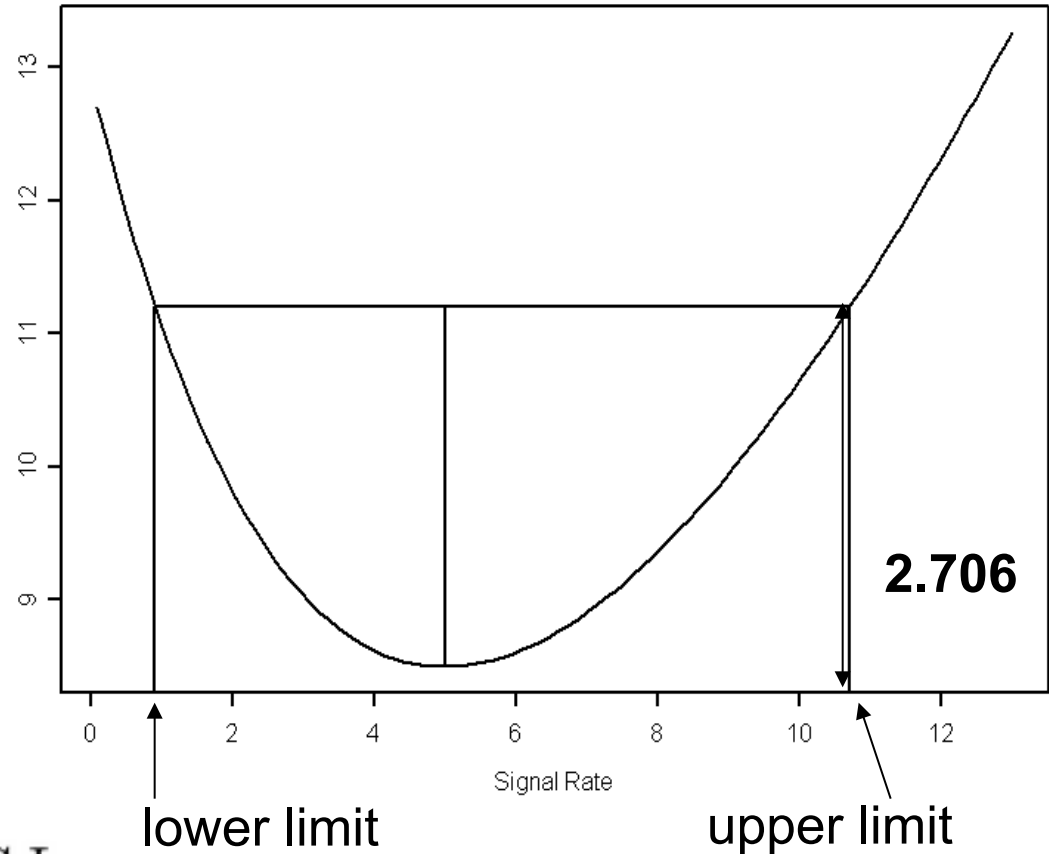
$\hat{s}, \hat{b}$  fitted signal and background levels  
respectively

To extract limits:

$$-2 \ln \lambda \approx \chi^2$$

$$\chi^2 - \chi_{min}^2 = 2.706 \quad \equiv \quad 90\% \text{ C.I.}$$

from Jan Conrad



[www.particle.kth.se/~conrad/NuFACT\\_25082006\\_Conrad.ppt](http://www.particle.kth.se/~conrad/NuFACT_25082006_Conrad.ppt)



# Computing the upper limit with python



```
from UnbinnedAnalysis import *  
from UpperLimits import *  
run the analysis as described earlier
```

*Final values:*

*Normalizat = 0.611601*

*Integral = 1.57993*

*Index = 2.32102*

*Integral = 0.43457*

*Index = 2.21217*

*Integral = 1.58454*

*Index = 3.15335*

*Prefactor = 1.29348*

*Integral = 15.6587*

*Index = 2.50804*

```
ul=UpperLimits(analysis)
```

```
ul['_3c454'].compute()
```

```
>>> v1,v2=ul['_3c454'].compute()
```

```
0 15.6587330996 0.000156784255523 1.57338580306e-06
```

```
1 15.7965473761 0.0848209382384 1.58725912491e-06
```

```
2 15.9343616525 0.326505145233 1.60113212085e-06
```

```
3 16.0721759289 0.722714903357 1.61500547877e-06
```

```
4 16.2099902053 1.27068113437 1.6288792121e-06
```

```
5 16.3478044817 1.9678234919 1.64275331967e-06
```

```
>>> print v1
```

```
1.63055727541e-06
```