

# **Enrico:** a Python package to simplify Fermi-LAT analysis

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**Abstract:** With the advent of the Large Array Telescope (LAT) on board the Fermi satellite, a new window on the Universe has been opened. Publicly available, the Fermi-LAT data come together with an analysis software named ScienceTools (ST, http://fermi.gsfc.nasa.gov/ssc/data/analysis/software/) which can be run through a Python interface. Nevertheless, for the user, the ST can be hard to run and imply several steps. Users already contributed with scripts for a specific task but no tool allowing a complete analysis is currently available.

We present a Python package called Enrico, designed to facilitate the data analysis. Using only configuration files and front end tools from the command line, the user can easily perform/reproduce an entire Fermi analysis and make plots for publications. It also include new features like debug plots, pipeline execution on one or several CPUs, downloading of the Fermi data or the generation of a sky model from the Fermi catalogue.

Enrico is an open-source project currently available for download at https://github.com/gammapy/enrico.

Keywords: Fermi, Software, Analysis tool

### 1 Introduction

One year after the launch of the *Fermi* satellite, the data gathered by the large Area Telescope (LAT) together with the software (ScienceTools, ST) were publicly released. Today more that 4 years of data were taken and a lot of discoveries were made.

LAT data can be analysed using the ST which are a collection of command line tools. The use of these tools requires some expertise and detailed tutorials <sup>1</sup> have been written by the LAT team.

While very complete, the ST lack several important features, e.g. spectrum and light-curve generation, etc..., and can be difficult to configure, hard to use on CPU clusters to take advantage of the availability of several computation cores. Based on the ST Python interface, few user contributions exist<sup>2</sup>. Most of them only perform a single task. The Enrico package, presented here, implements a full analysis chain, missing features and simplifies the data analysis.

#### 2 Features

The main features of this package can be summarised as follows:

- It uses the ST to analyse the LAT data (FITS file production, minimisation, etc...). The Enrico command line tools are just front-ends for functions and classes in the Enrico Python package.
- Analysis is simplified, Enrico generates Xml model files, FITS files and paper-quality plots with a few commands.
- Results are reproducible, because configuration files and logs are used.
- Good default options that are suitable for most analyses.

• Control plots were added to ensure the reliability of the analysis.

Written in Python, the code is portable and does not rely on the CPU architecture nor on the ST version. Documentation, tutorial and instructions for installation are available at http://enrico.readthedocs.org.

The Enrico package includes a job submission module allowing some parallelisation of the tasks, mainly for spectra (energy bins) and light curves (time bins). Currently the MPIK $^3$  and LAPP $^4$  clusters are supported but others can easily be added by the user.

## 3 A simple analysis

### 3.1 Prepare and run your analysis

Few steps need to be done before actually running the *Fermi* analysis. The command-line tools work with a configuration file that needs to be generated. This is done by: > enrico\_config PKS2155.conf where PKS2155.conf is the name of the configuration files that will be created. For this exemple, the blazar PKS 2155-304 has been analysed using data from MET=239557418 to MET=271093418 with an energy range from 100 MeV to 300 GeV.

Few questions will be asked about the analysis to perform (source name, position, time, energy range, etc...). The *Fermi* data analysis uses a sky model written in an xml file. The package reads the 2FGL catalogue [1] to generate a coresponding xml model using the tool:

> enrico\_xml PKS2155.conf

l. see http://fermi.gsfc.nasa.gov/ssc/data/
analysis/

<sup>2.</sup> see http://fermi.gsfc.nasa.gov/ssc/data/
analysis/user/

<sup>3.</sup> http://www.mpi-hd.mpg.de/

<sup>4.</sup> http://lapp.in2p3.fr/



The produced xml file contains all the sources with the user-defined region of interest plus 10 degrees. Only sources within 3 degrees around the source have their parameters free to vary. Several spectral models are supported (Power-Law, PowerLaw2, LogParabola, PLExpCutoff, Generic). At this point, the likelihood analysis implemented in gtlike, can be simply performed with the command:

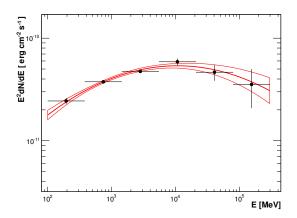
enrico\_sed PKS2155.conf

A full spectrum and also data points (see Fig. 1) are then computed. The covariance matrix obtained during the minimisation process is then used to compute the 68% error contour also called butterfly. If the source is not detected (i.e. below the user-defined TS), an upper limit is computed.

Lightcurves (Fig. 2) and TS maps can be produced by Enrico using:

- > enrico\_lc PKS2155.conf
- > enrico\_tsmap PKS2155.conf

The previous commands run several jobs either in parallel by submitting them to a cluster or sequentially one after the other. A single job is very similar to a spectrum calculation. FITS files that are need by gtlike are produced and the minimisation is performed either in time bins (light-curves) or in space bins (TS map). For each tool, the generation of the FITS files can be skipped if they have already been produced in a previsous analysis. This allows to save CPU time in the cases of recomputation of the best-fit values after a change in the sky model for exemple.



**Fig. 1**: Spectral energy distribution of the Blazar PKS 2155-304 as obtained with Enrico and the tools enrico\_sed and enrico\_plot\_sed.

Enrico has a module to produce paper-quality plots, saved in eps, .C (ROOT format) and png:

- > enrico\_plot\_sed PKS2155.conf
- > enrico\_plot\_lc PKS2155.conf
- > enrico\_plot\_tsmap PKS2155.conf

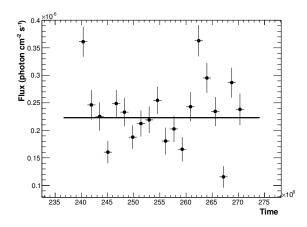
It is also posible to compute the log-likelihood value of several spectral models assumed for the source of interest. Tested models are PowerLaw, LogParabola and PLExpCutoff. The tool is called by:

> enrico\_testmodel PKS2155.conf

#### 3.2 Configuration file

The configuration file is a ascii file automatically generated by the package but that can be edited by the user. An exemple is presented in Fig. 3.

A configuration file is divided in sections. It contains simple sections (e.g. **energy**, **time**) in which the user defines



**Fig. 2**: light-curve of the Blazar PKS 2155-304 as obtained with Enrico and the tools enrico\_lc and enrico\_plot\_lc.

```
[target]
    name = PKS2155
    ra = 329.7
    dec = -30.2
    spectrum = PowerLaw

[space]
    xref = 329.7
    yref = -30.2
    rad = 8.0
    srcpix = 120
    nxpix = 200
    nxpix = 200
    ntong = 120.0
    ntat = 120.0
    binsz = 0.1
    coordsys = CEL
    proj = AIT
    phibins = 0.0

[time]
    tmin = 239557418.0
    tmax = 271093418.0

[energy]
    emin = 100.0
    emax = 300000.0
    enumbins_per_decade = 10

[analysis]
    likelihood = binned
    evclass = 2
    ComputeDiffrsp = yes
    zmax = 100.0
    roicut = no
    filter = DATA_QUAL==1&&LAT_CONFIG==1&&ABS(ROCK_ANGLE
    irfs = P750URCE_V6
    convtype = -1

[fitting]
    optimizer = MINUIT
    ftol = 1e-06
```

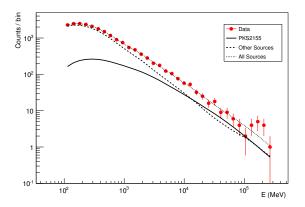
Fig. 3: Exemple of a configuration file for Enrico.

cuts applied for all analysis. More specific sections exist and are used by only one tool (e.g. section **spectrum** for enrico\_sed).

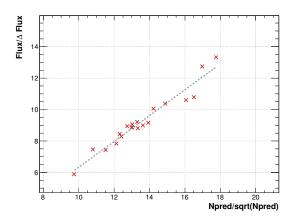
### 3.3 Check your results

While in principle straightforward, the ST might be tricky to use and the results of a *Fermi* data analysis should be checked. Enrico proposes few control plots in order to ensure the reliability of an analysis.

For the spectrum, a count plot (Fig. 4) and a residual plot are produced. For the light-curves, a plot,  $N_{\rm pred}/\sqrt{N_{\rm pred}}$  vs Flux/ $\Delta$  Flux (Fig. 5), is made to unsure the good computation of the errors since the two values must be correlated. Count map, model map and residual map (Fig. 6) are also automatically produced and can be used to see if a source should be added to the sky model or have its paramters free.



**Fig. 4**: Counts plot showing the number of count per bins and the different model components (Source, other objects and total) as fitted by gtlike.



**Fig. 5**: Plot  $(N_{\text{pred}}/\sqrt{N_{\text{pred}}} \text{ vs Flux}/\Delta \text{ Flux})$  used to decide whether the errors in the light-curves are well computed.

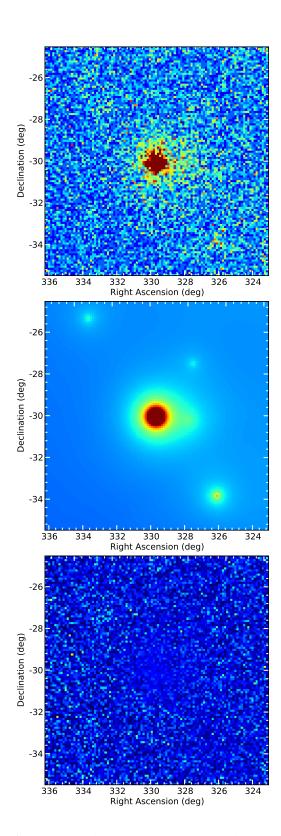
### 4 Conclusions

Enrico is a powerful tool written in Python to run the *Fermi* ScienceTools. With the addition of debug plots and submission of several job on cluster of CPUs, rapid, robust and reproducible analyses can be performed easily. The implementation of automatic download of data from the FSSC data server for a given sky region, energy band and time range is being implemented as part of the astroquery.fermi module (see https://github.com/astropy/astroquery), which is a Python package to access public astronomy data services on the web.

We invite the reader to try Enrico for *Fermi* LAT data analysis. Start by downloading it from https://github.com/gammapy/enrico and browsing the documentation at http://enrico.readthedocs.org.

#### References

[1] Nolan, P. L., Abdo, A. A., Ackermann, M., et al. 2012, ApJS, 199, 31



**Fig. 6**: From top to bottom: Counts map, Model map and residuals. The first two maps are produced with the ST (with gtbinand gtmodelmap) and the last is produced by Enrico to allow the user to check the sky model.