

## Case Study: Acquiring Image Data from ZTF, and Displaying and Working with Images in Python

For this exercise, we will access the IRSA database for ZTF directly and determine the time and location of a supernova in M101. A series of tutorials in Python will also be explored to enable you to open images, scale and work with the images and their headers, and access some of the advanced features of image analysis within IRAF through Python.

So let's get started! This exercise assumes that you have installed the Anaconda Python distribution, and also the Pyfits packages. If you have both of those you should be able to get everything to work; most of it will work with just the Stock Anaconda package, which includes numpy. You can get instructions for installing Anaconda at this site: [http://phares.caltech.edu/ipdf/ipdf\\_SummerSchool\\_2014/handson-intro.html](http://phares.caltech.edu/ipdf/ipdf_SummerSchool_2014/handson-intro.html).

### Part 1: M101 Supernova with PTF

To begin, let's use IRSA find the PTF images for the supernova in M101 which went off recently (in 2011).

You can access IRSA and its PTF data directly at <http://irsa.ipac.caltech.edu/Missions/ptf.html>

If you arrive at the main IRSA page, you can also see all the other missions that are available - IRSA has complete datasets for nearly every NASA infrared mission, and is a gold mine of data for your research. PTF is listed under "other missions" - and may require a login to get full access to everything. Jason Surace can enable you to have such access - just create an account from the IRSA page, and email Jason ([jason@ipac.caltech.edu](mailto:jason@ipac.caltech.edu)) to request this full access. For today you can use my login which is email [bryan.penprase@yale-nus.edu.sg](mailto:bryan.penprase@yale-nus.edu.sg) and password *ztfrocks*. You should see a page like the one below - this is the entry point!



The screenshot shows the NASA/IPAC Infrared Science Archive (IRSA) website. At the top, there is a navigation bar with links for IRSA, DATA SETS, SEARCH, TOOLS, and HELP. Below this, the Palomar Transient Factory (PTF) mission is highlighted. There are three main icons: PTF Image Service, Catalog Search, and PTF Documentation. Below these icons is a section titled "Mission Characteristics" which contains a table with the following information:

Description:	PTF is a fully-automated, wide-field survey aimed at a systematic exploration of the optical transient sky.
Lifetime:	2009 - present
Wavelength:	g, R, H alpha
Area Coverage:	approx. 30,000 deg <sup>2</sup>
Instruments:	12Kx8K, 7.8 square degree CCD array (CFH12K) re-engineered for the 1.2-m Oschin Telescope at Palomar Observatory
Funding Agency:	PTF is a collaboration of Caltech, LBNL, IPAC, Berkeley, LCOGT, Oxford, Columbia and the Weizmann Institute.
Canonical Papers:	PTF: Law et al. (2009) Photometric calibrator catalog: Ofek et al. (2012)

Choose the PTF image service, and enter your target information below. For our search we are using the M101 galaxy; the IRSA server can resolve names and find coordinates - this include names for supernovae and other transient events. (HINT: For the M101 supernova, it is helpful to give the software a larger image size than the 500 arc second default; I used 750 and found the SN near the top of the image).

The screenshot shows the IRSA PTF web interface. At the top, there are navigation tabs for 'IRSA', 'DATA SETS', 'SEARCH', 'TOOLS', and 'HELP'. Below this is a search bar with the text 'Search by Position: M101, Type=ZTF, Image Size=2,000 (deg, Pixel Size=0.5)'. A table of search results is displayed, with columns for 'expid', 'datetime', 'crval1', 'crval2', 'filter', 'ocid', 'ptfield', 'seeing', and 'airmass'. The first row is highlighted in green. To the right of the table is an 'Image Preview' window showing a grayscale image of the M101 galaxy with a small blue circle indicating the location of a supernova.

expid	datetime	crval1	crval2	filter	ocid	ptfield	seeing	airmass
22693	2012-04-08 00:28:02.260000	210.3372082	52.8982095	R	6	200019	2.16	1.56
22798	2012-04-08 04:14:23.150000	210.3372746	52.8984133	R	6	200019	2.44	1.61
22799	2012-04-08 06:07:38.630000	210.3372787	52.8983601	R	6	200019	2.14	1.23
22837	2012-04-09 03:48:15.140000	210.3372135	52.8984662	R	6	200019	2.49	1.74
22838	2012-04-09 03:49:56.760000	210.8953880	54.8237481	R	10	4607	2.39	1.65
22850	2012-04-09 04:42:24.830000	210.8953853	54.8238526	R	10	4607	2.40	1.42
22847	2012-04-09 05:38:16.240000	210.8953828	54.8238763	R	10	4607	1.98	1.26
22852	2012-04-09 06:08:13.240000	210.3372476	52.8984662	R	6	200019	1.93	1.22
22833	2012-04-09 07:20:38.240000	210.3372329	52.8984327	R	6	200019	2.70	1.11
22827	2012-04-11 05:54:58.140000	210.3372386	52.8986787	R	6	200019	2.30	1.24
22837	2012-04-11 06:45:41.740000	210.3372358	52.8984125	R	6	200019	2.18	1.25
22844	2012-04-11 07:28:00.140000	210.3372665	52.8981252	R	6	200019	1.79	1.30
22836	2012-04-11 03:38:46.240000	210.3372089	52.8982931	R	6	200019	2.01	1.98
22841	2012-04-11 06:50:45.140000	210.3372317	52.8984239	R	6	200019	1.80	1.12
22851	2012-04-11 10:21:58.260000	210.3372373	52.8983241	R	6	200019	2.18	1.30

Scroll through the vast number of images and see if you can spot the supernova! Find out when the first image was taken with ZTF that showed a hint of the supernova. What are the coordinates of the supernova? How quickly does it rise? (the cursor gives flux per pixel and coordinates; you can use this to get an approximate light curve).

You can check boxes and stage the images for download that you might want to use. Try to see if you can get one of the images downloaded, and display it with your favorite image display program (I use ds9; it is available at <http://ds9.si.edu/site/Download.html>).

Take a moment and be awed by the vast amount of data at your finger tips! How could this database help you in your summer research? Try to see if there are ZTF holdings for objects that you are studying (quasars, variable stars, etc)!

## Part 2: Basic Python and Image Display

There are a really amazing number of Python tutorials and resources available now. I have provided a summary of them at our web site at <http://ztf.common.yale-nus.edu.sg/python-and-resources/>.

After trying many of the tutorials, I think I have found 2-3 that are most useful. You may fly through these, with everything working - or not! My experience is that it is really important to be sure you have installed Python (and perhaps some additional packages), and then start Python correctly. Finally you need to load packages into Python - most of my errors came from not pre-loading packages, and Python is very dumb about trying to find packages that are not explicitly loaded.

A note on configuration...

You will notice if you have not already noticed that many of the tutorials online will bomb at a crucial point, usually because a key library is not loaded or a key routine is not included. For this effort, we will need the following ingredients - if you have them you can skip forward to the next section.

**Ingredient A:** Anaconda Python. This can be found easily and is free! It includes a lot of great libraries pre-built. You can find instructions on how to get it at: [http://phares.caltech.edu/iptf/iptf\\_SummerSchool\\_2014/handson-intro.html](http://phares.caltech.edu/iptf/iptf_SummerSchool_2014/handson-intro.html).

**Ingredient B:** Pyfits Library. This is an essential library for astronomers. You can find it at [http://www.stsci.edu/institute/software\\_hardware/pyfits/Download](http://www.stsci.edu/institute/software_hardware/pyfits/Download). Go to the line that says:

**PyFITS Version 3.3.0**

Current stable release (Source)

To install this library, you download the file, and then copy it to the place where your Anaconda Python distribution is located, in the subdirectory of pkgs. For our laboratory laptops this would be in the directory /Anaconda/pkgs.

Copy the file to the location /Anaconda/pkgs - it should have a name like 'pyfits-3.3'

You can move the entire thing to the right directory using this command:

```
cd ~/Downloads  
cp -r pyfits-3.3 /Anaconda/pkgs/.
```

Then you can install the package using this command:

```
cd /Anaconda/pkgs/pyfits-3.3  
ipython setup.py install
```

This will install the package so you are ready to rock!

**Ingredient C:** img\_scale routine

Many times when you are running Python people will recommend a routine or another. img\_scale is used in one of our tutorials. It can be easily downloaded from this page:

<http://www.astrobetter.com/wiki/tiki-index.php?page=RGB+Images+with+matplotlib>

Once at this point, download the file **img\_scale.py**

You will want to put that file in the directory /Anaconda/bin/

This can be done with the command:

```
cp ~/Downloads/img_scale.py /Anaconda/bin/.
```

## **Tutorials**

A very good first tutorial for Python is at the python4astronomers site at <http://python4astronomers.github.io/plotting/matplotlib.html>.

To run this, you will probably need to start up Python in a Terminal with

```
> ipython --matplotlib
```

For me this gives this set of lines:

```
bep04747-macair:~ bpenprase$ ipython --matplotlib
Python 2.7.9 |Anaconda 2.0.1 (x86_64)| (default, Dec 15 2014,
10:37:34)
Type "copyright", "credits" or "license" for more information.
```

```
IPython 3.0.0 -- An enhanced Interactive Python.
Anaconda is brought to you by Continuum Analytics.
Please check out: http://continuum.io/thanks and https://binstar.org
?          -> Introduction and overview of IPython's features.
%quickref  -> Quick reference.
help       -> Python's own help system.
object?    -> Details about 'object', use 'object??' for extra details.
Using matplotlib backend: MacOSX
```

In [1]:

The line is your input line, and you can paste commands into there. For the image display tutorial, I was able to get (nearly) everything to work – but only after pre-loading some routines.

You will also need to preload some images for the exercise – this would include for this first part the image known as stinkbug.png – it is on our web site.

Here are several lines for loading in the packages you will need:

```
In [1]: import pyfits
In [2]: import numpy as np
In [3]: import pylab as py
In [4]: import img_scale
In [5]: import matplotlib.pyplot as plt
In [6]: import matplotlib.image as mpimg
```

Then after that you should be able to run the full tutorial for image display – and changing image scales, and making nice plots using this tutorial:

[http://matplotlib.org/users/image\\_tutorial.html](http://matplotlib.org/users/image_tutorial.html)

Some of the first parts of that tutorial are below for convenience:

```
In [7]: img=mpimg.imread('stinkbug.png')
```

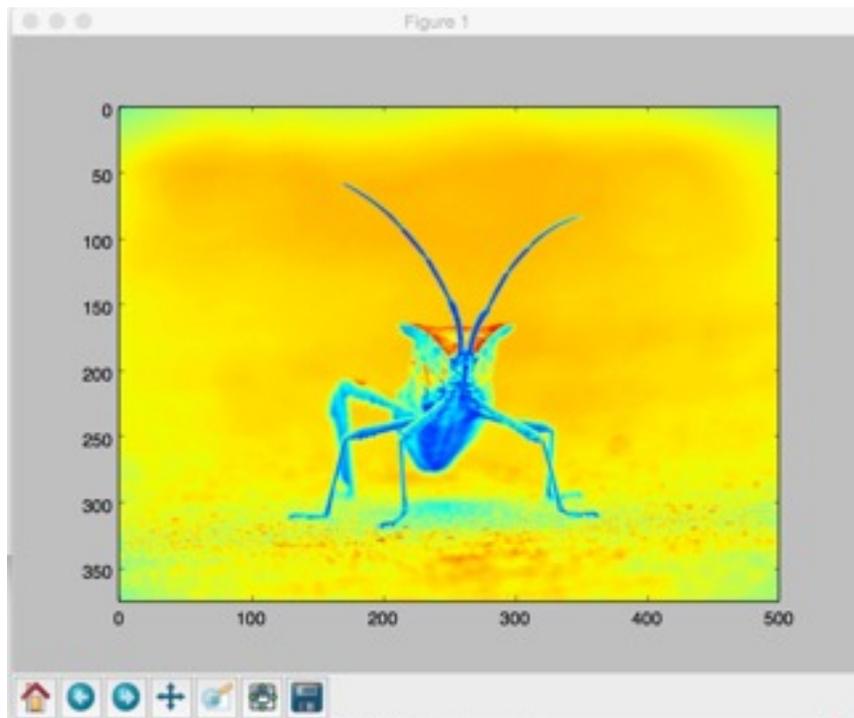
```
Out[7]:
```

```
In [8]: imgplot = plt.imshow(img)  
(Source code, png, hires.png, pdf)
```

```
../_images/image_tutorial-1.png
```

You can also plot any numpy array – just remember that the datatype must be float32 (and range from 0.0 to 1.0) or uint8.

Before long – you should be able to produce these kind of cool looking bug images!



### **Part 3a: More advanced Image Display**

If you got here - congrats! Here are some more advanced tutorials. Our student Meredith Durbin (Pomona College '14) created a wonderful tricolor image exercise!

See if you can do this tutorial:

<http://meredith-durbin.com/matplotlib/tricolor/>

This will create a beautiful version of the Eagle Nebula which will demonstrate a lot of advanced Python features. You will need the set of tricolor images for the Eagle Nebula, available on the MAST server for HST at the URL of <https://archive.stsci.edu/prepds/heritage/m16/datalist.html>

For convenience – here are some links to the data needed for the tricolor image exercise:

WFC3–UVIS F502n:

[https://archive.stsci.edu/pub/hlsp/heritage/m16/hlsp\\_heritage\\_hst\\_wfc3-uvis\\_m16\\_f502n\\_v1\\_drz.fits](https://archive.stsci.edu/pub/hlsp/heritage/m16/hlsp_heritage_hst_wfc3-uvis_m16_f502n_v1_drz.fits)

WFC3–UVIS F657n:

[https://archive.stsci.edu/pub/hlsp/heritage/m16/hlsp\\_heritage\\_hst\\_wfc3-uvis\\_m16\\_f657n\\_v1\\_drz.fits](https://archive.stsci.edu/pub/hlsp/heritage/m16/hlsp_heritage_hst_wfc3-uvis_m16_f657n_v1_drz.fits)

WFC3–UVIS F673n:

[https://archive.stsci.edu/pub/hlsp/heritage/m16/hlsp\\_heritage\\_hst\\_wfc3-uvis\\_m16\\_f673n\\_v1\\_drz.fits](https://archive.stsci.edu/pub/hlsp/heritage/m16/hlsp_heritage_hst_wfc3-uvis_m16_f673n_v1_drz.fits)

You will want to download those images and save them in the directory where you are running Python.

At the end of this tutorial you should be able to create an image like the one below!



### **Part 3b: More advanced Image Display**

This one leads you through an exercise of creating a tricolor image out of three monochrome filtered images. You can use the HST images on our site but will need to save them to the file names of “J.fits” “H.fits” and “K.fits” to paste in the commands. For convenience I used the three images at the site <http://www.astro.yale.edu/mgeha/Singapore/Arp194/> and copied them to J.fits, H.fits and K.fits. All of these files are in the directory ZTFfiles.

You can start up python in the usual way with

```
ipython --matplotlib
```

Then you can paste in some of the commands from the tutorial at:

<http://www.astrobetter.com/blog/2010/10/22/making-rgb-images-from-fits-files-with-pythonmatplotlib/>

For convenience, I have made a file called tricolor1.py that you can use to cut and paste commands. Note that for a tricolor image the scaling commands adjustments need different values; you can experiment to get the color balance. These commands worked for me to produce a somewhat green tricolor image:

```
In [88]: img[:, :, 0] = img_scale.sqrt(k_img, scale_min=0,
scale_max=0.01)
In [89]: img[:, :, 1] = img_scale.sqrt(h_img, scale_min=0,
scale_max=0.01)
img_scale : sqrt
In [90]: img[:, :, 2] = img_scale.sqrt(j_img, scale_min=0,
scale_max=0.01)
```

The rest of the exercise should work well – good luck! A very large reward to anyone who can find the images that go with the Tutorial (the J.fits, H.fits, and K.fits images).

### **Part 4: Even More advanced Image Display**

As part of the PTF/ZTF boot camp, we have an exercise which is extremely complete. You can use the images from the above exercise to examine image headers, move around in the images, and produce a grey scale display image.

This exercise is at:

[http://phares.caltech.edu/iptf/iptf\\_SummerSchool\\_2014/astropy-boot-camp.html](http://phares.caltech.edu/iptf/iptf_SummerSchool_2014/astropy-boot-camp.html)

You can play with this long tutorial at your leisure. For our short session you can skip to the part that covers satrapy and working with images.

Just load in the requisite packages first – there are a lot of them for this to work!

This is one thing that most beginners stumble over – the libraries have to be installed first for things to work, and within each routine you have to invoke the many and various things for the program to use. For convenience I have made a file called leosinger.py that has everything set up to display an image.

Here are the libraries I had to use to get his tutorial to work:

```
import numpy as np
import matplotlib.pyplot as plt
import matplotlib.image as mimg
import astropy.coordinates
import astropy.units as u
import astropy.io.fits
import astropy.stats
import astropy.table
import astropy.wcs
import astropy.cosmology
import scipy.optimize
import scipy.odr
```

Then you can use these command to open up the image, display image headers, and do lots of other things – ENJOY!

```
In [28]: fits = astropy.io.fits.open('J.fits')
In [29]: hdu = fits[0]
In [30]: hdu.header
Out[30]:
SIMPLE =                T / Fits standard
BITPIX =               -32 / Bits per pixel
```

The exercise leads through a useful image display and analysis exercise which should work with any image – and lots of ways of connecting to PYRAF and other more advanced functions.

All of the commands are at

[http://phares.caltech.edu/iptf/iptf\\_SummerSchool\\_2014/astropy-boot-camp.html](http://phares.caltech.edu/iptf/iptf_SummerSchool_2014/astropy-boot-camp.html)

and in the file leosinger.py

Now let's plot the image data. But let's use sigma-clipping to pick a nice scale for the image.

```
clipped_data = astropy.stats.sigma_clip(hdu.data.flatten())
mid = np.median(clipped_data)
std = np.std(clipped_data - mid)
```

```
plt.figure(figsize=(20, 10))
plt.imshow(hdu.data, vmin=mid-std, vmax=mid+3*std, cmap='binary')
plt.xlabel('pixel $x$')
plt.ylabel('pixel $y$')
```

<matplotlib.text.Text at 0x10e95fb90>

