3. NUMERICAL METHODS II

JHU Physics & Astronomy Python Workshop 2017

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DATA FILES: WHERE THE PARTY'S AT

At some point, you need to do more than just play with numbers that you've generated in your python code, and getting that data into and out of your python environment is important.

DATA FILE TYPES

Two main categories of data files:

Human Readable	Binary-based
Pro: Can see data in your text editor	**Con:** Looks like a bunch of 1s and 0s
Con: No standardization, at the mercy of whoever formatted it	**Pro:** (Usually) easy to load and get access to data
Con: Difficult to store "metadata"	**Pro:** Made to store metadata
Con: Slow, Large	**Pro:** Fast, Small
Con: Whole file must be read in	**Pro:** Can read only the stuff you want

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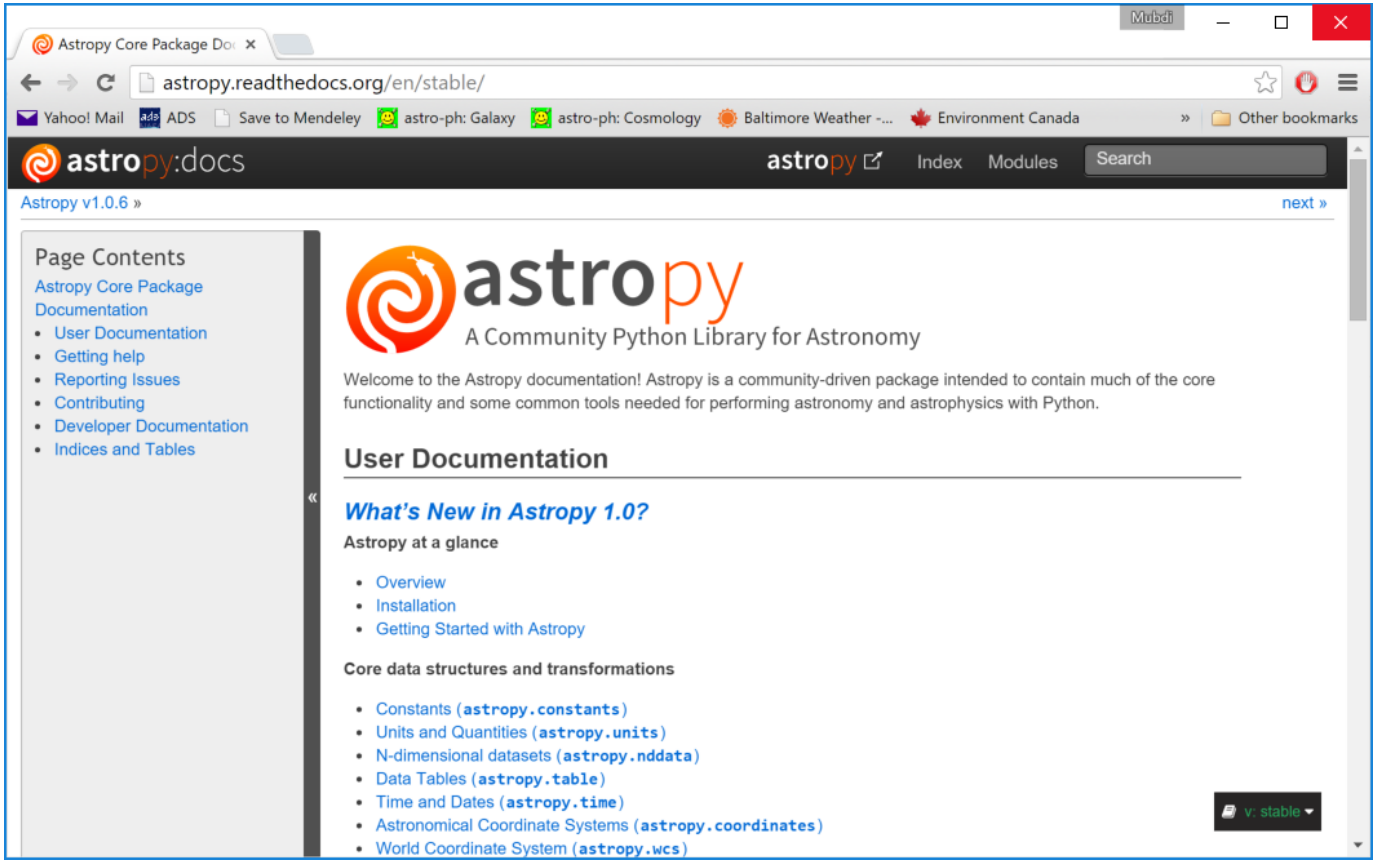
	Pro: Made to store metadata
	Pro: Fast, Small
	Pro: Can read only the stuff you want

PRO TIP:

There are many binary-based formats, including HDF5 and NetCDF, all of which have python interfaces. In this workshop, we'll go in depth with **FITS files**

INTRODUCING ASTROPY!



Contains lots 'o useful functionality for astronomy & beyond.

The Docs: http://astropy.readthedocs.org/en/stable/

INTRODUCING ASTROPY!

PRO TIP:

astropy is not installed by default in the Enthought Canopy installation. Please install it now (if you haven't already) through the package manager.

Contains lots 'o useful functionality for astronomy & beyond.

The Docs: http://astropy.readthedocs.org/en/stable/

FITS FILES!

A useful (binary) format commonly used in astronomy to store image or tabulated data.

astropy.io.fits
`(from astropy.io import fits)`

We'll use this for FITS images

astropy.table
`(from astropy.table import Table)`

We'll use this for FITS (and other) tables

FITS FILES!

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PRO TIP:

When you import something with a capital letter first (i.e., from astropy.table import Table), you're importing a class. These are special types of variables with useful *methods*

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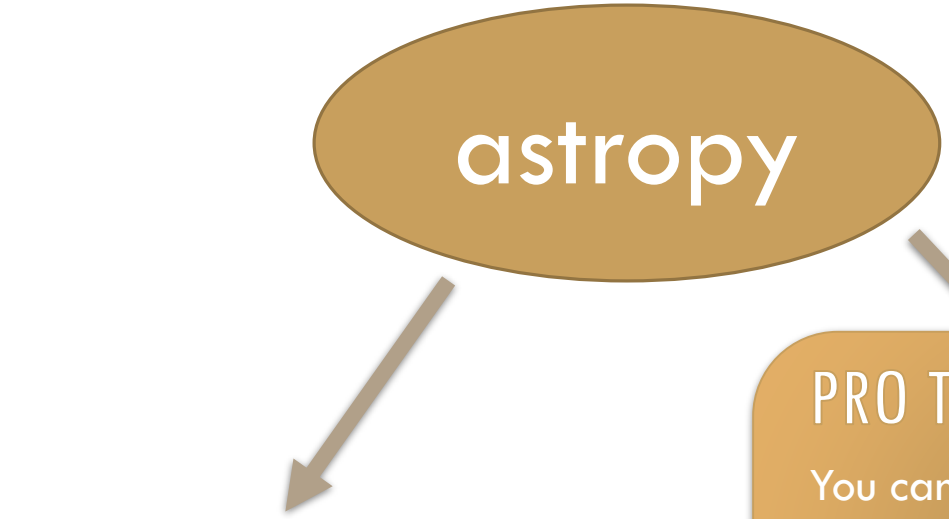
We'll use this for FITS (and other) tables

FITS FILES!



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astropy.io.fits
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We'll use this for FITS images

PRO TIP 2:

You can also deal with tables through the normal astropy.io.fits interface. The "table" interface is quite slick, however and makes life easier (especially when making new tables).

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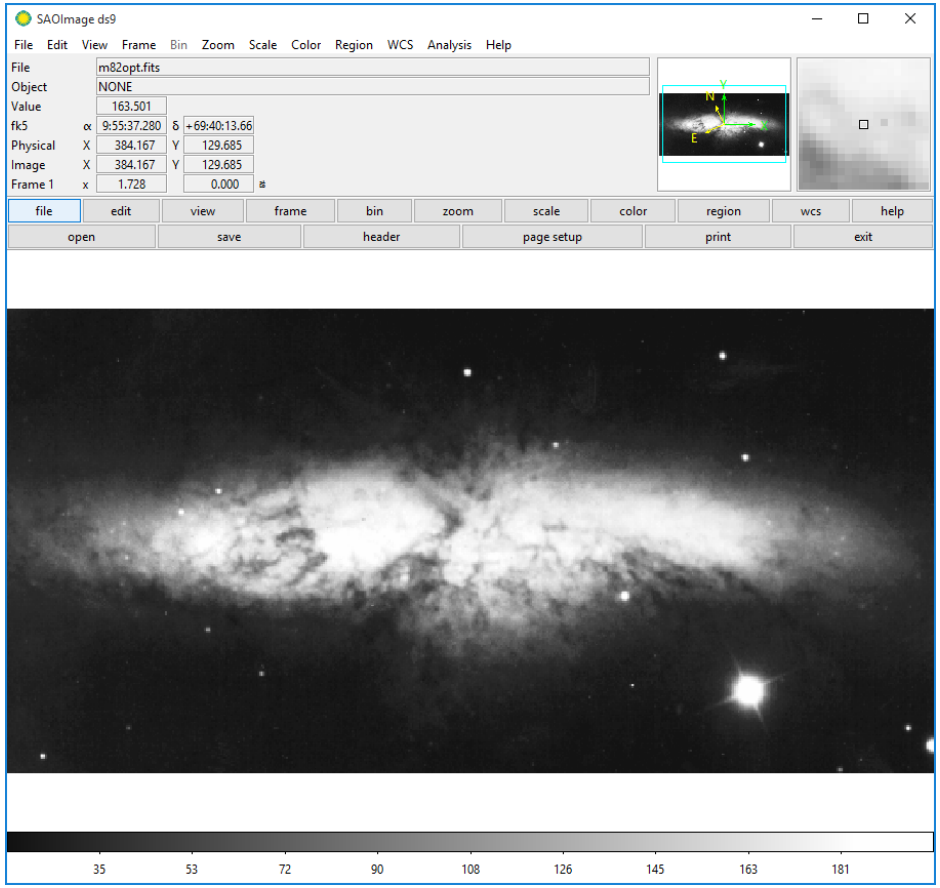
FITS IMAGES



A FITS file open in DS9 (a common viewer)

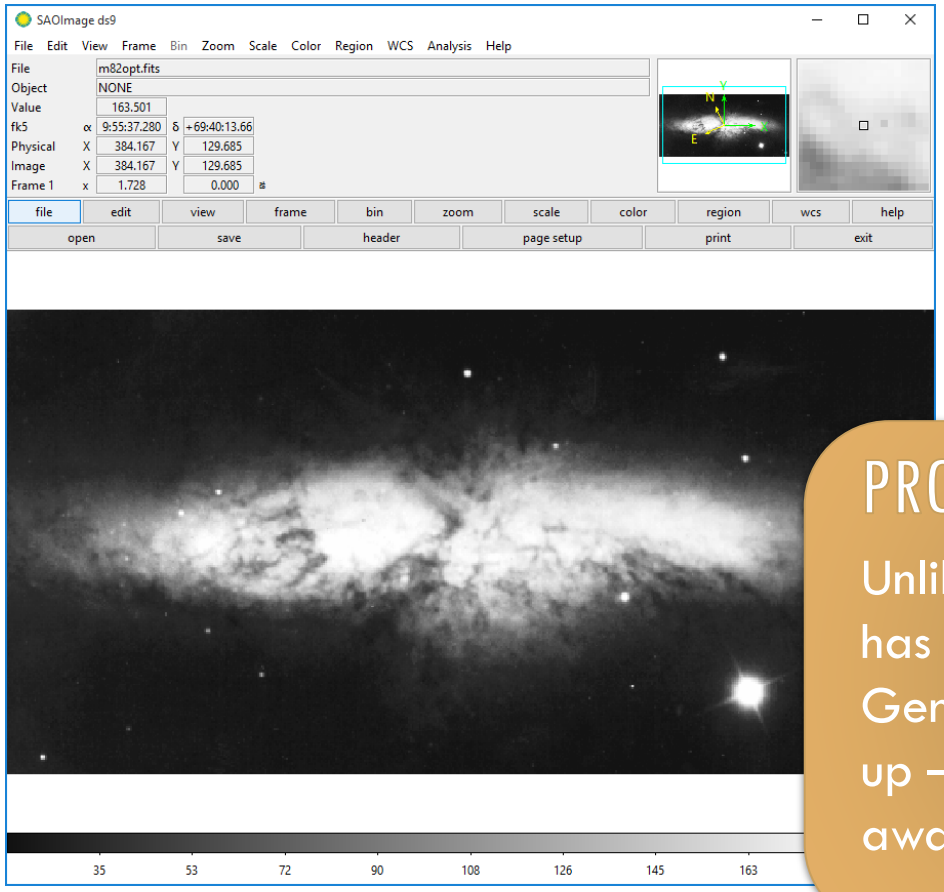
FITS files can store multidimensional data (commonly 2 or 3 dimensions).

Any given FITS file can contain multiple images (or tables) called **extensions**

Every FITS extension contains a **header** and **data**.

FITS headers can contain World Coordinate System (wcs) information that indicates where a given pixel is on the sky

FITS IMAGES



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PRO TIP:

Unlike python, FITS convention has indexing starting at 1. Generally astropy covers this up – but you should be aware of this.

READING IN FITS IMAGES

Convenience functions make reading FITS images easy:

```
from astropy.io import fits
img1 = fits.getdata(filename) # Getting the image
head1 = fits.getheader(filename) # and the Header
```

This opens the image as a Numpy array, and the header as a "dictionary-like" object (i.e., you can access the individual header keywords through "`head1['key']`").

To open other extensions in the fits file:

```
img1 = fits.getdata(filename, 0) # Primary Ext
img2 = fits.getdata(filename, 1) # Second Ext
img2 = fits.getdata(filename, ext=1) # Equivalent
```

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PRO TIP:

In addition to local files, you can open FITS files on the internet by using the url as opposed to the file name.

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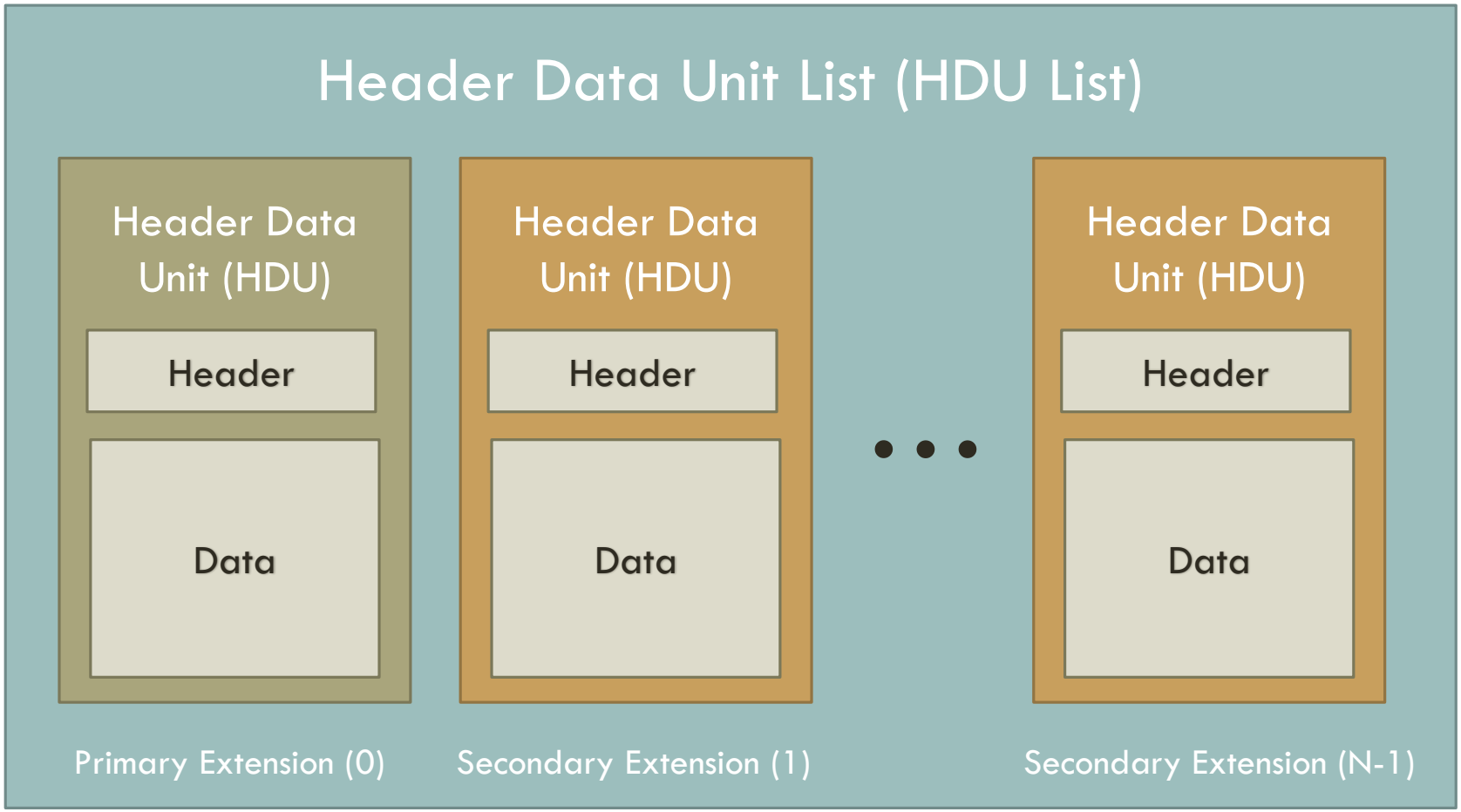
```

PRO TIP 2:

This is **not** the most efficient way to open a FITS file, especially larger ones. If you want to manipulate large data sets multiple times, there's a faster way.

FITS FILES: A MORE TECHNICAL REVIEW

Basic structure of a FITS file:



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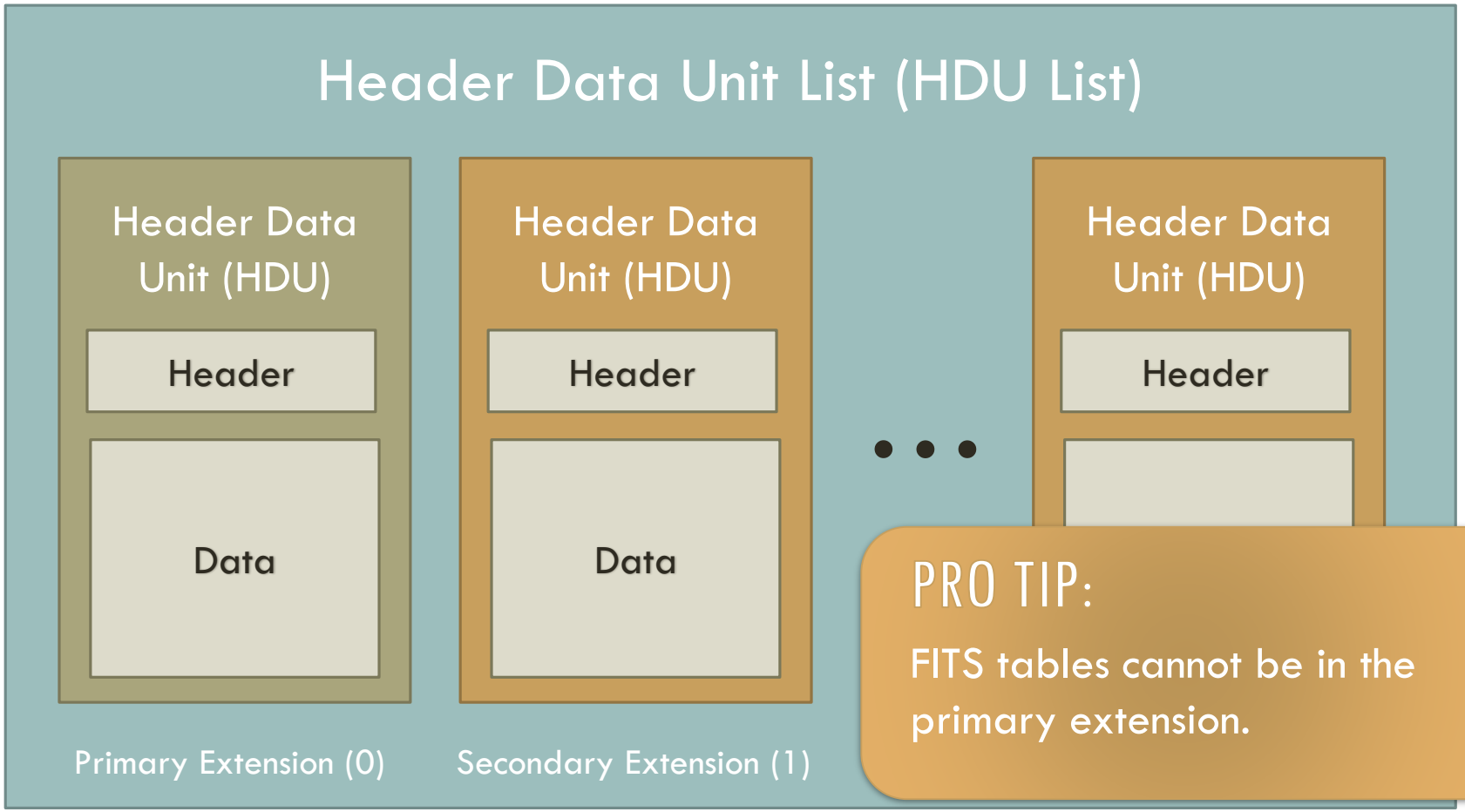

READING IN A FITS FILE (EXPANDED)

Reading a file, now knowing what a FITS file consists of:

```
hdulist = fits.open(filename) # Getting the HDUlist
hdulist.info() # The composition of the file
```

Now getting the header and/or data:

```
head0 = hdulist[0].header # Primary Ext Header
data0 = hdulist[1].data # Second Ext Data
```

Writing to a new file and closing:

```
hdulist.writeto(filename)
hdulist.close() # Closing the FITS file
```

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PRO TIP:

FITS files are read in such that the first axis (often the RA for astronomical images) is read in as the last axis in the numpy array. Be sure to double check that you have the axis you need.

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PRO TIP 2:

writeto will, by default, fail if you try to overwrite an existing file. To force an overwrite, pass the clobber argument:

```
clobber = True
```

WRITING OUT A FITS IMAGE

Making a new FITS image is also easy from a Numpy array:

```
# Making a Primary HDU (required):
primaryhdu = fits.PrimaryHDU(arr1) # Makes a header
# or if you have a header that you've created:
primaryhdu = fits.PrimaryHDU(arr1, header=head1)

# If you have additional extensions:
secondhdu = fits.ImageHDU(arr2)

# Making a new HDU List:
hdulist1 = fits.HDUList([primaryhdu, secondhdu])

# Writing the file:
hdulist1.writeto(filename, clobber=True)
```

SHORT DETOUR: GLOB MODULE

In one of the many useful python packages, **glob** lets you get lists of files using wildcards:

```
import glob

# Getting list of all files in current directory:
filelist1 = glob.glob('*') # or
filelist1 = glob.glob('./*')

# Getting list of all files in all directories two
levels down with the extension '.fits':
filelist2 = glob.glob('*/*/*.fits')
```

SHORT DETOUR: OS MODULE

Additionally, the **os** module provides a large number of useful filesystem functions:

```
import os

# Basic File Operations:
os.remove(filename) # Delete file named filename
os.rename(oldfilename, newfilename) # Rename file
os.mkdir(dirname) # Making new directory

# Path functions:
os.path.exists(loc) # Checks if loc exists
# Splits loc into directory and file
os.path.split(loc)
# Splits loc into path+file and extension
os.path.splitext(loc)
```

SHORT DETOUR: LAMBDA FUNCTIONS

Sometimes you want to define a simple function without the full function syntax. **Lambda functions** exist for this exact reason:

```
# Defining the Function:
funct1 = lambda x: x**2 # Returns the square of x

# Using the Function:
tmpvar1 = funct1(5)

# Can use multiple variables:
funct2 = lambda x,y: x + y

# Using the Function:
tmpvar2 = funct2(5, 6)
```

TABLES (& FITS TABLES)

While you can use the FITS interface to open tables, Astropy makes it very easy and convienient with the **astropy.table** interface:

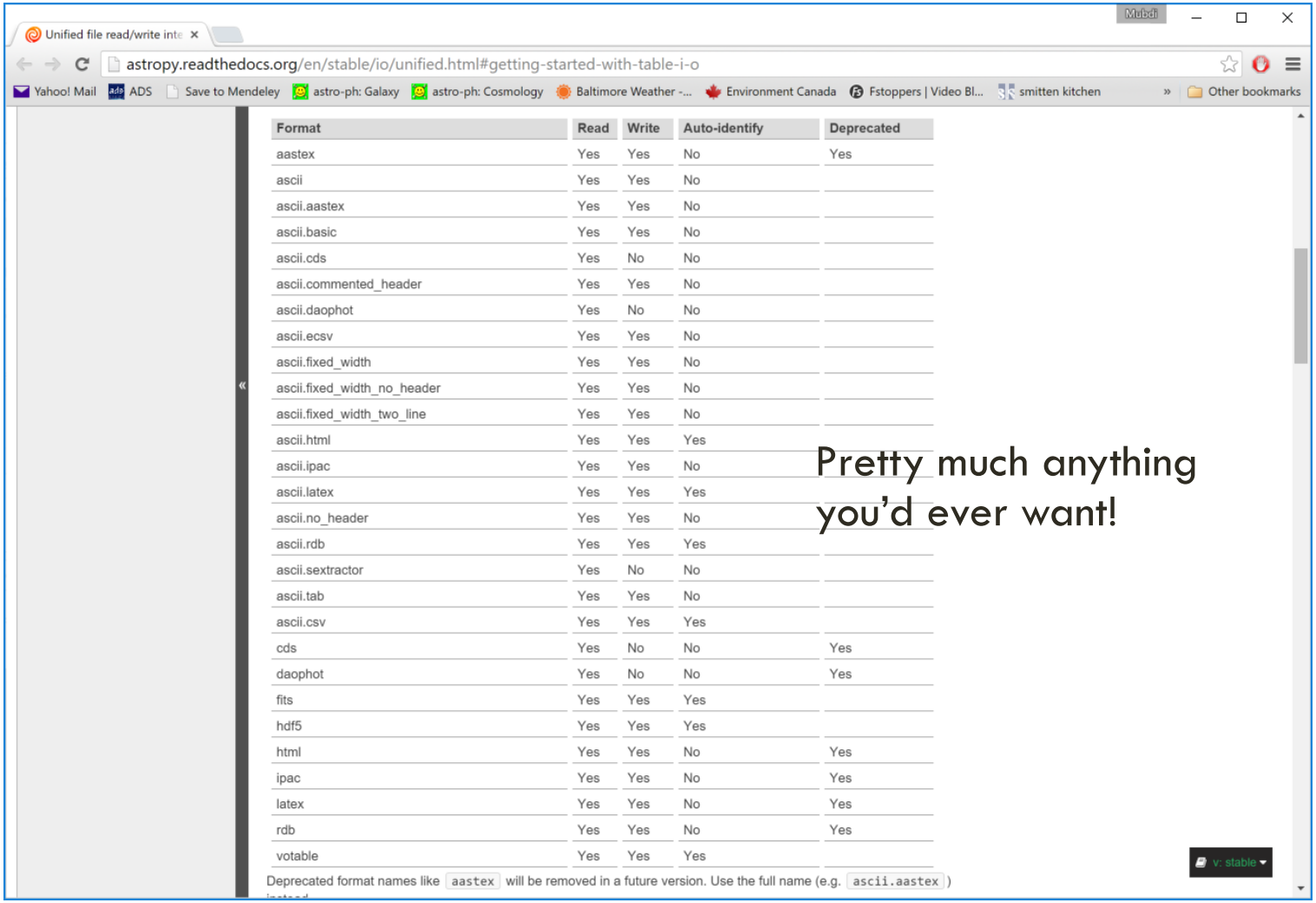
```
from astropy.table import Table

# Getting the first table
t1 = Table.read(filename.fits)

# Getting the second table
t2 = Table.read(filename.fits, hdu=2)
```

This provides a *really* flexible **Table** object that is a pleasure to deal with. It is easy to access different types of data, and read in and output to a wide variety of formats (not just FITS)

TABLE FORMATS



Format	Read	Write	Auto-identify	Deprecated
aastex	Yes	Yes	No	Yes
ascii	Yes	Yes	No	
ascii.aastex	Yes	Yes	No	
ascii.basic	Yes	Yes	No	
ascii.cds	Yes	No	No	
ascii.commented_header	Yes	Yes	No	
ascii.daophot	Yes	No	No	
ascii.ecsv	Yes	Yes	No	
ascii.fixed_width	Yes	Yes	No	
ascii.fixed_width_no_header	Yes	Yes	No	
ascii.fixed_width_two_line	Yes	Yes	No	
ascii.html	Yes	Yes	Yes	
ascii.ipac	Yes	Yes	No	
ascii.latex	Yes	Yes	Yes	
ascii.no_header	Yes	Yes	No	
ascii.rdb	Yes	Yes	Yes	
ascii.sextractor	Yes	No	No	
ascii.tab	Yes	Yes	No	
ascii.csv	Yes	Yes	Yes	
cds	Yes	No	No	Yes
daophot	Yes	No	No	Yes
fits	Yes	Yes	Yes	
hdf5	Yes	Yes	Yes	
html	Yes	Yes	No	Yes
ipac	Yes	Yes	No	Yes
latex	Yes	Yes	No	Yes
rdb	Yes	Yes	No	Yes
votable	Yes	Yes	Yes	

Deprecated format names like `aastex` will be removed in a future version. Use the full name (e.g. `ascii.aastex`) instead.

Pretty much anything you'd ever want!

PLAYING WITH TABLE DATA

A table is both a **dictionary-like** and **numpy array-like** data type that can either be accessed by key (for columns) or index (for rows):

```
# Getting column names, number of rows:
t1.colnames, len(t1)

# Getting specific columns:
t1['name1'], t1[['name1', 'name2']]

# Getting specific rows (all normal indexing works):
t1[0], t1[:3], t1[::-1]

# Where searching also works:
inds = np.where(t1['name1'] > 5)
subtable = t1[inds] # Gets all columns
```

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```

PRO TIP:

Extracting a single column will give you a Numpy array-like variable with all your favourite methods attached.

MAKING A TABLE

To make a table manually is easy with Numpy arrays:

```
# Given two columns (1D) arr1 and arr2:
t1 = Table([arr1, arr2], names=(“a”, “b”))

# The columns are named “a” and “b”.

# Adding an additional column:
col1 = Table.Column(name=“c”, data=arr3)
t1.add_column(col1)

# Adding an additional row:
row = np.array([1, 2, 3])
t1.add_row(row)
```

WRITING OUT A TABLE

Writing out a table is also quite simple:

```
# Writing out FITS table:
t1.write(filename.fits)

# Writing out specific text type:
t1.write(filename.txt, format='ascii.tab')

# Can even write out to LaTeX:
t1.write(filename.tex, format='ascii.latex')
```

WRITING OUT A TABLE

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# Writing out FITS table:
t1.write(filename.fits)

# Writing out specific text type:
t1.write(filename.txt, format='ascii.tab')

# Can even write out to LaTeX
t1.write(filename.tex, format
```

PRO TIP:

To quickly investigate a table in a nicely formatted manner, you can do:

```
t1.show_in_browser()
```

EXERCISE TIME!

To tell you I'm sorry for everything that I've done.