

## Is VO ready for machine learning?

#### Windows

Windows crashed again. I am the Blue Screen of Death. No one hears your screams.

- Press any key to terminate the application. Press CTRL+ALT+DEL again to restart your computer. You will lose any usaved data in all applications.

Press any key to continue

05/14/19

## **Challenges**

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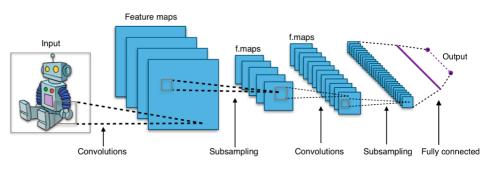
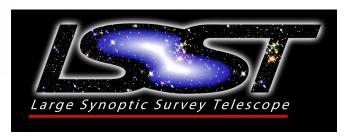


Image from Wikipedia



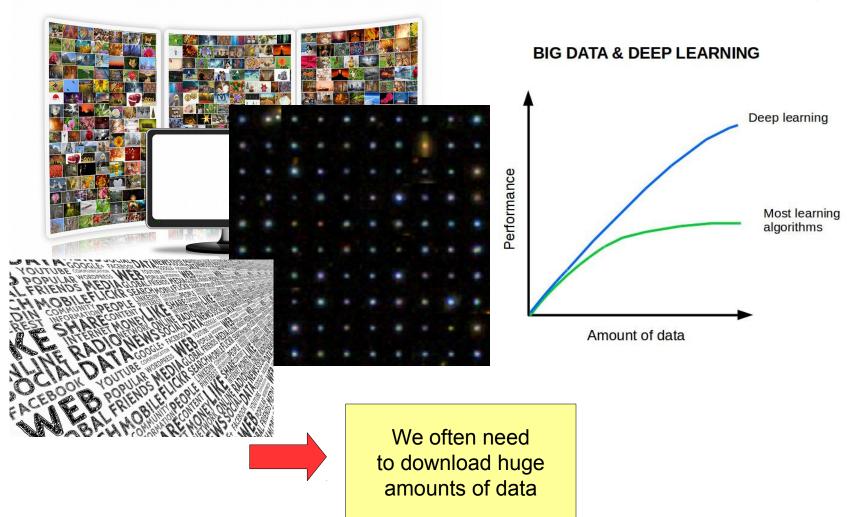


Big Data by Nick Youngson CC BY-SA 3.0 Alpha Stock Images



## We are hungry for data!



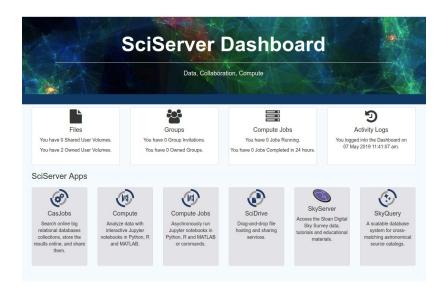


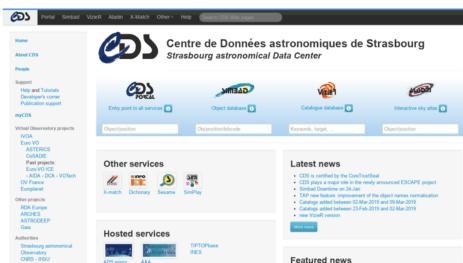
## **Catalogs**

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## Working with catalogs is a simple task:



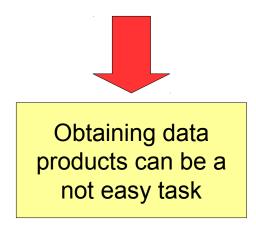


Problems start with images and spectra!

## Some "simple" tasks...



- 1. Given the coordinates, download 28x28 pixel<sup>2</sup> images for all the quasars in SDSS.
- 2. Download some hundreds of thousands of images from FIRST/UKIDSS.
- 3. Download all the HARPS spectra from ESO archive.



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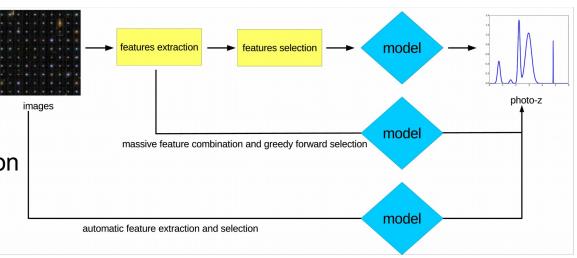


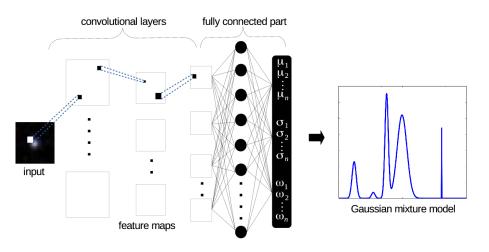
Scientific problem:

Photometric redshift estimation



Deep Convolutional Mixture Density Network (DCMDN)





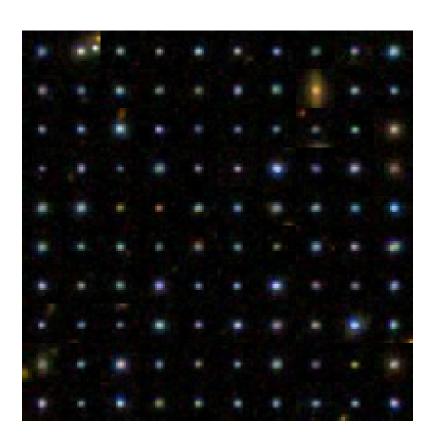


- 185,000 quasar from SDSS DR7/DR9
- 200,000 galaxies from SDSS DR9
- •200,000 stars from SDSS DR9 (redshift set to 0)



Need for 28x28 pixel<sup>2</sup> images in *ugriz* filters

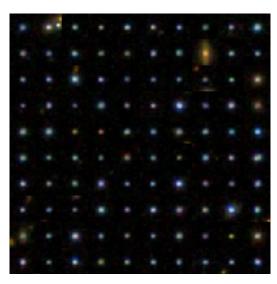


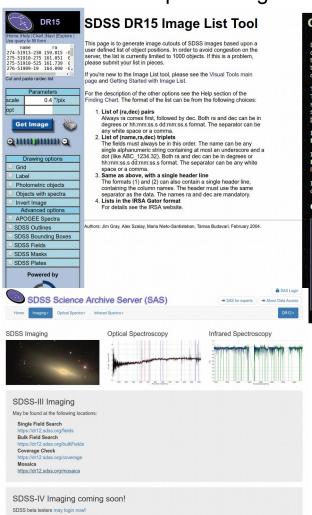


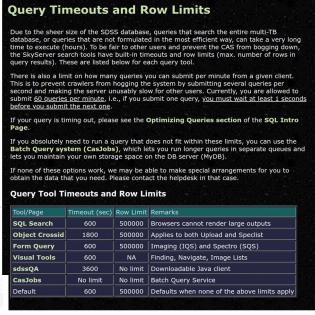
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#### Given the coordinates, download 28x28 pixel<sup>2</sup> images for all the quasars in SDSS:







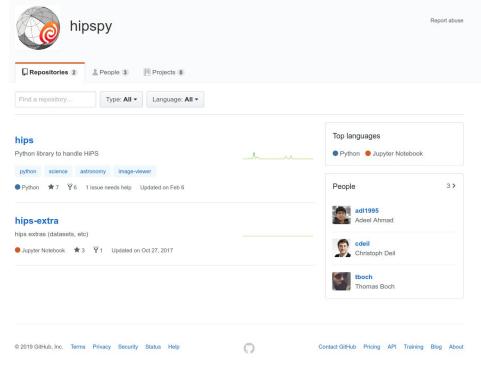
## **HiPS: Hierarchical Progressive Survey**

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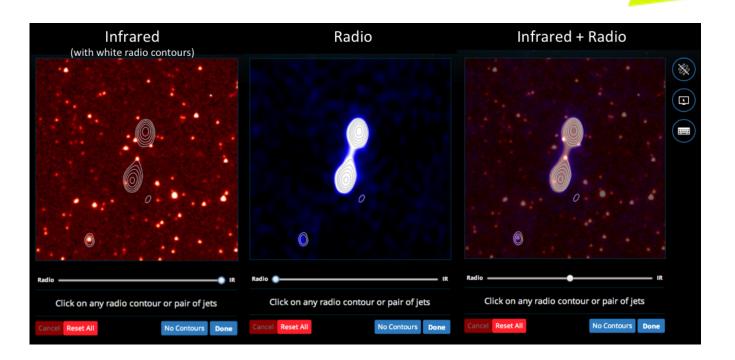
Based on HEALPix sky tesselation → mapping of survey data at various spatial resolutions into a collection of HEALPix tiles





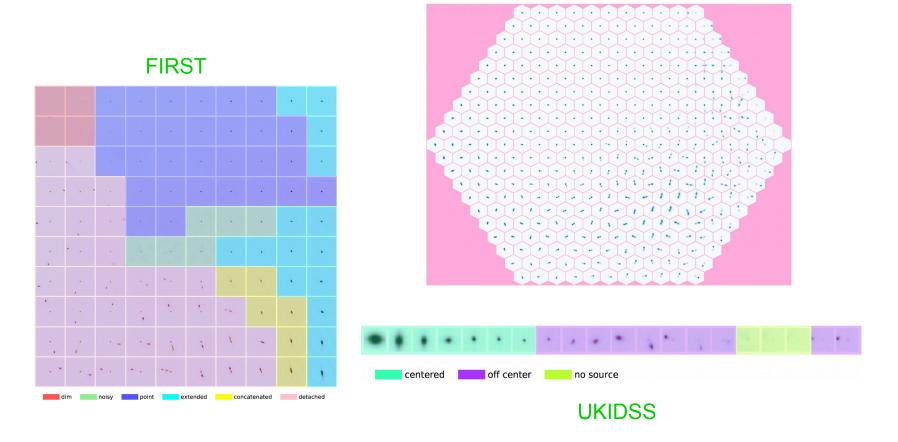


Classifying radio galaxies with the help of tens of thousands of citizen scientists





Morphological classification from image data using PINK (Parallelized rotation and flipping INvariant Kohonen maps)

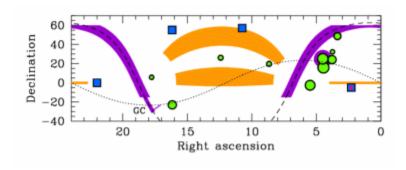




Download some hundreds of thousands of images from FIRST/UKIDSS: No HiPS! UKIDSS:

UKIDSS is a set of five surveys. The areas and 5-sigma depths are as follows:

1.	::	Large Area Survey (LAS)	4000 sq. degs	K=18.4	extraGalactic
2.	H	Galactic Plane Survey (GPS)	1800 sq. degs	K=19.0	Galactic
3.	H	Galactic Clusters Survey (GCS)	1400 sq. degs	K=18.7	Galactic
4.	H	Deep Extragalactic Survey (DXS)	35 sq. degs	K=21.0	extraGalactic
5.	::	Ultra Deep Survey (UDS)	0.77 sq. degs	K=23.0	extraGalactic



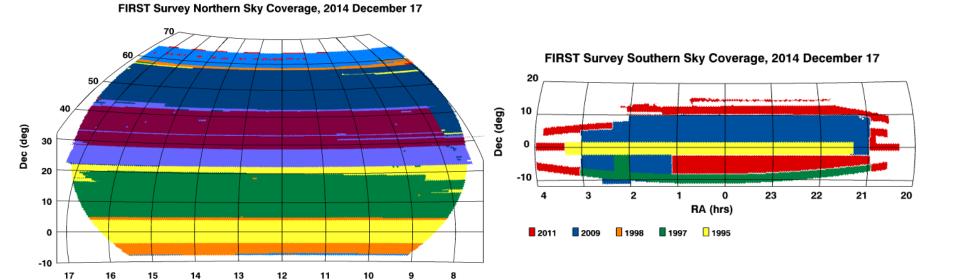
#### Main problems:

- Online service
  - Only extracts data from tiles which contain the coordinate (no way to combine tiles)
- Sensitivity
  - Lack of stacked images (Y, J, H, K)
- astroquery.ukidss available in astropy, but VERY VERY slow download (requiring 6-8 weeks) and still affected by previous problems
  - ➤ When using more clients → DOS attack
- Solution?
  - Download entire survey and implement our own methods for accessing the data
  - Used KDTree to find tiles and coadded images

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#### FIRST:

RA (hrs)



Main problem: No publicly accessible method to download huge amount of data



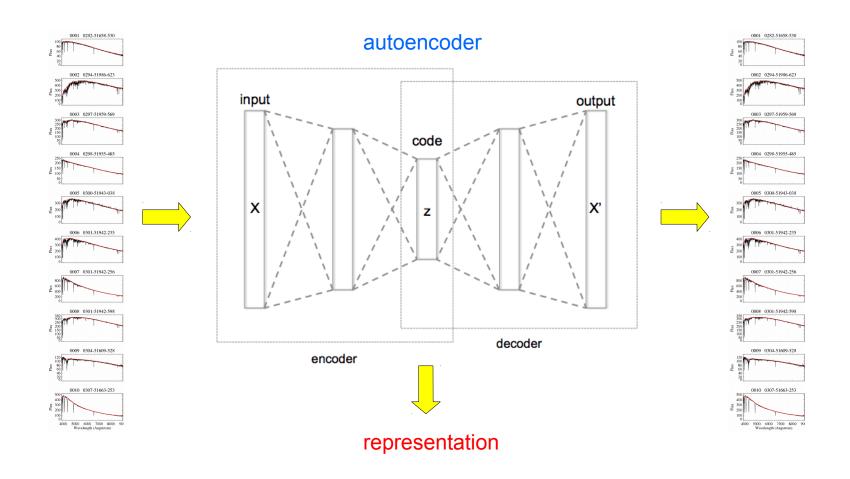
Asking friends and colleagues for data and support can be helpful, but it is not what VO is about

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#### ESCAPE project – Development of toy example for:

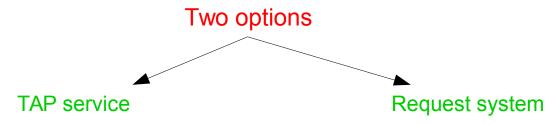
#### Dimensionality reduction and classification on spectra

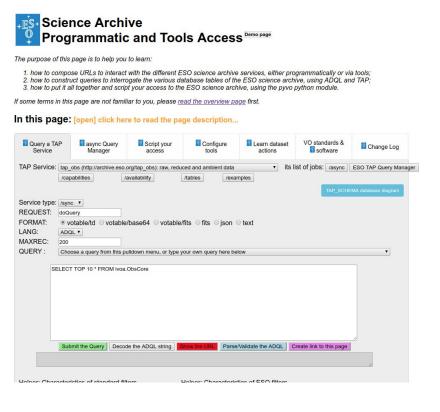






#### Download all the HARPS spectra from ESO archive:



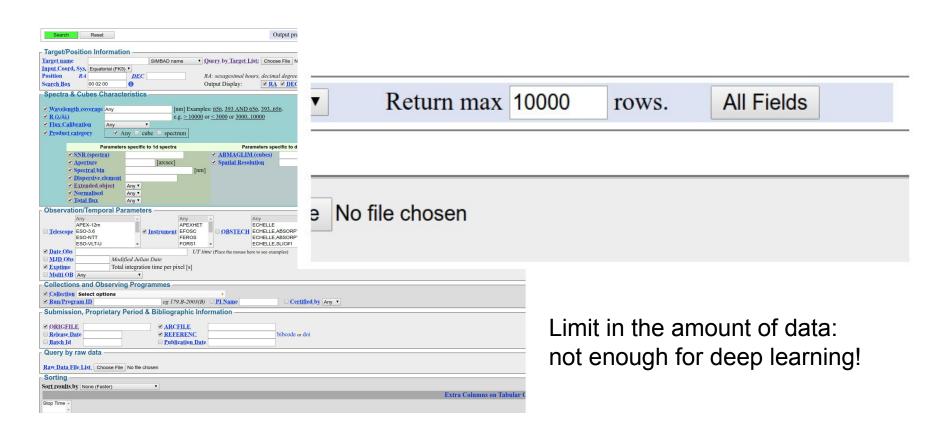


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#### **Problems found:**



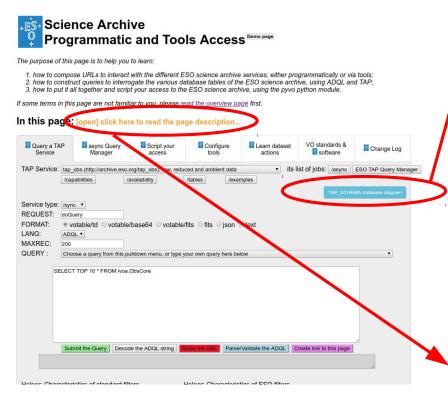
#### Request system



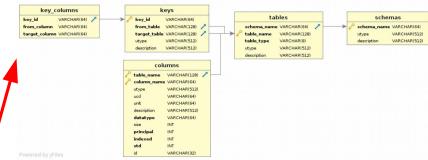
#### **Problems found:**



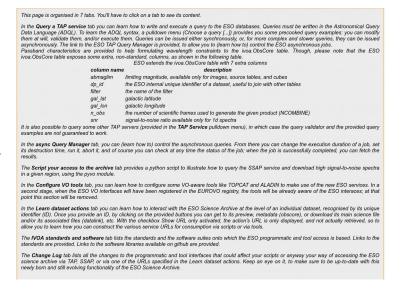
#### **TAP** service



Absence of a clear schema browser



Poor and unclear documentation



#### Solutions?



 Python script available on request (thanks Alberto Micol!), but frequent crashes experienced → still investigating the problem

Download much slower with respect to request system



Asking friends and colleagues for data and support can be helpful, but it is not what VO is about

## Bringing code to the data



Uploading my code and work on server side could solve many issues...





Who is going to provide and pay for resources?



#### **Conclusions**



- Download of data products, in particular images and spectra, can easily become a nightmare
- Apparently simple tasks are not simple at all
- Bringing code to the data could be a solution
- A big effort is required from all of us to improve the situation

We are constantly speaking of LSST, SKA, the data explosion in astronomy, but...

Seriously, what are we going to do with them?



# No data service or provider has been harmed during this talk!

