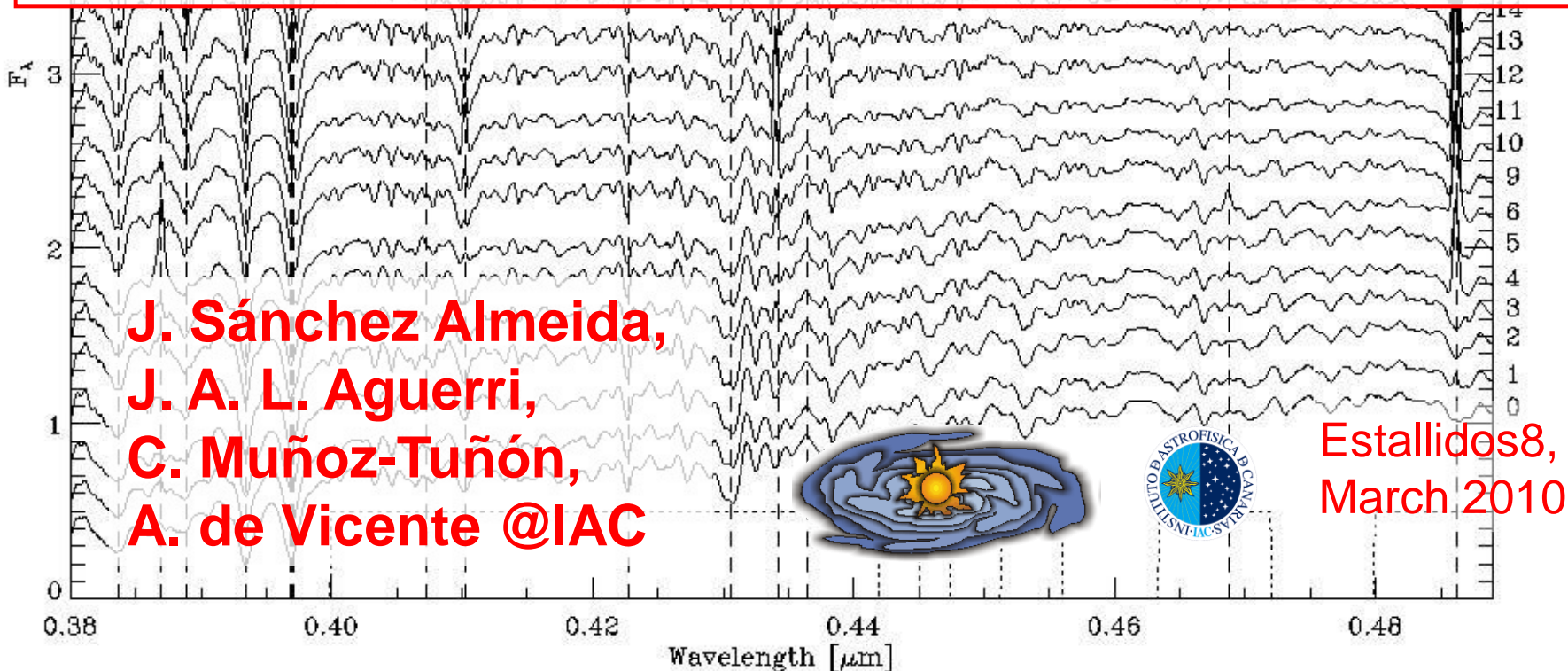


Automatic Unsupervised Spectral Classification of all SDSS/DR7 Galaxies



Summary

- ❑ Motivation
- ❑ The classification method: k-means clustering algorithm
 - ❑ ASK classification of the full SDSS/DR7
- ❑ Properties of the classes
- ❑ Uses
- ❑ Conclusions

Motivation

- ❖ Need to simplify

The nebulae are so numerous that they cannot be studied individually. Therefore, it is necessary to know whether a fair sample can be assembled from the most conspicuous objects and, if so, the size of the sample required. (Hubble, 1936)

- ❖ spectral catalogs far more complete than ever now freely available (SDSS/DR7)

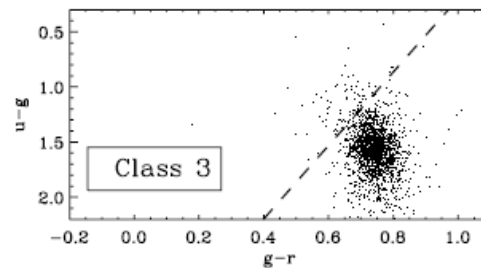
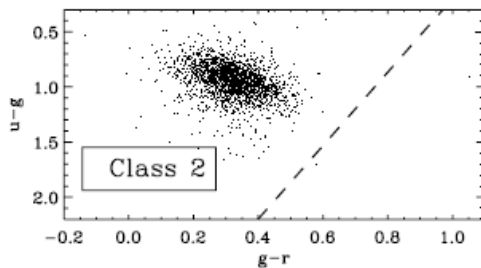
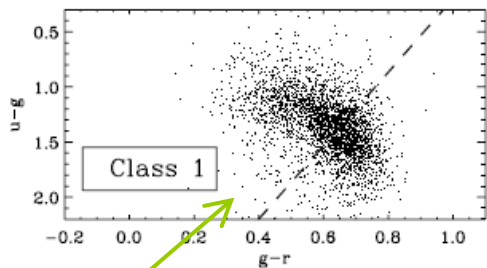
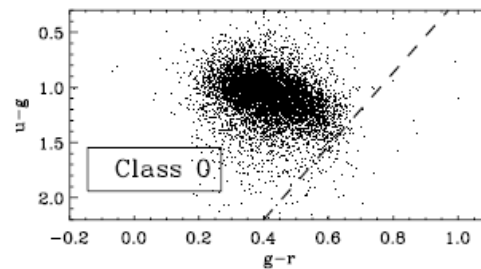
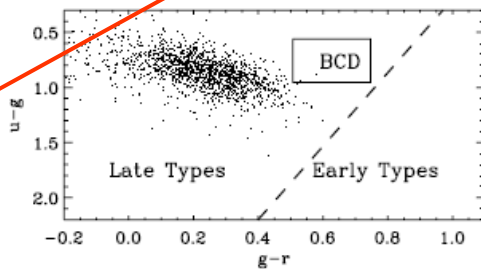
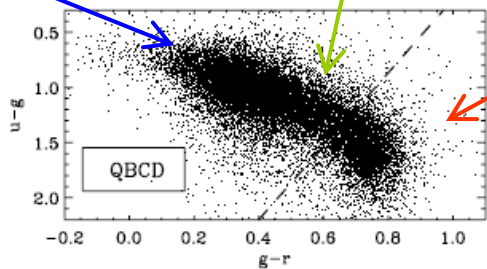
- ❖ **k-means** separates galaxies in the green valley

In the local universe, galaxies come in two colors: red and blue (e.g., Balogh et al. 2004). They are loosely connected with Hubble types (E \equiv red, S \equiv blue)

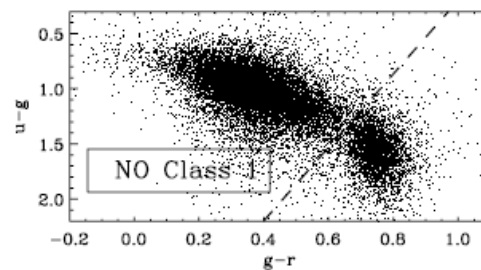
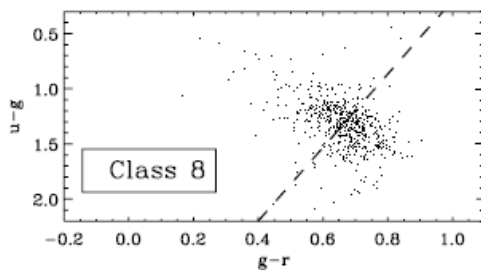
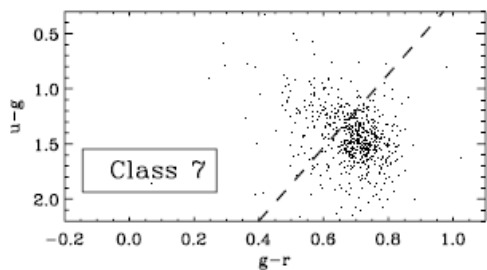
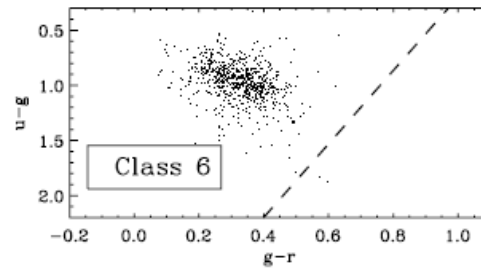
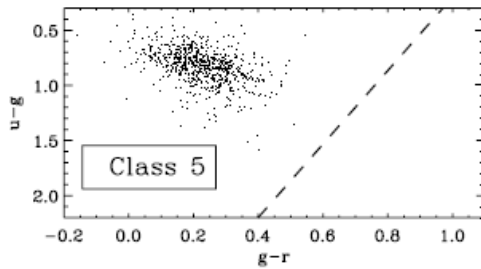
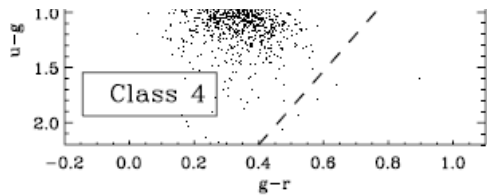
blue cloud

green valley

red sequence



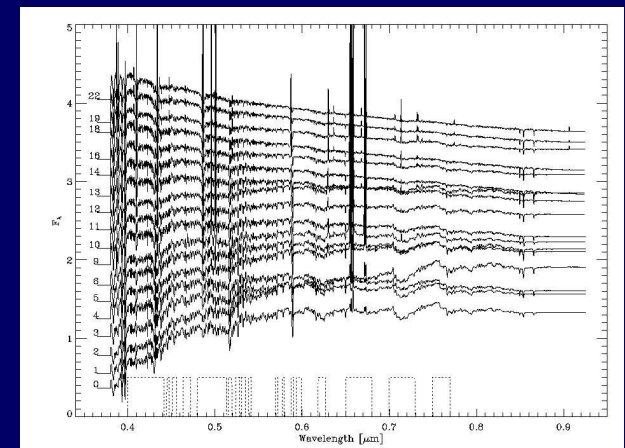
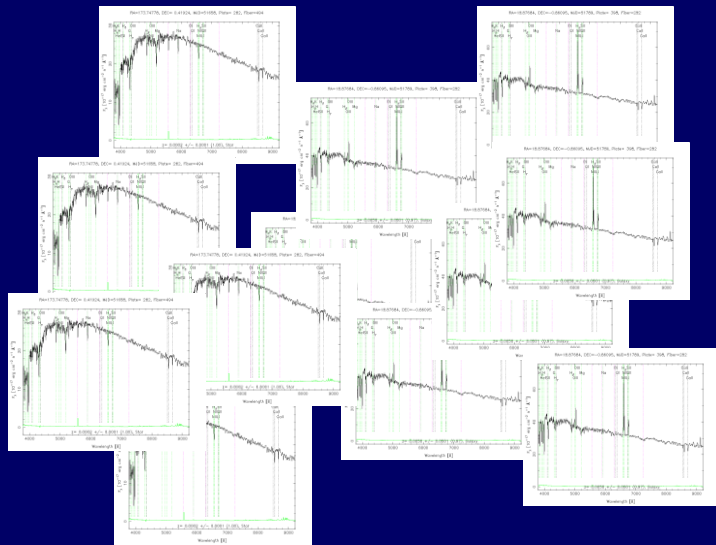
green valley alone!



The classification method: k-means clustering algorithm



pixels properties
cluster around 10 \rightarrow
RGB classes



How does k-means work?

class 1

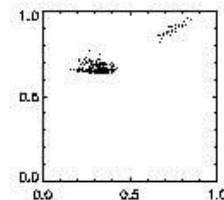
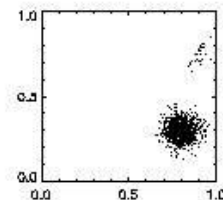
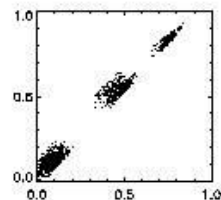
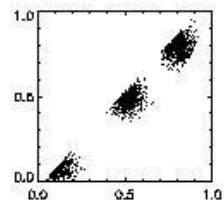
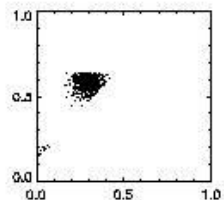
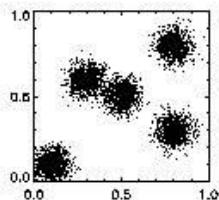
class 2

class 3

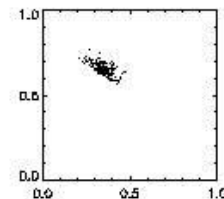
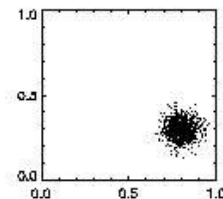
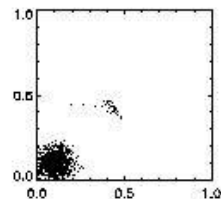
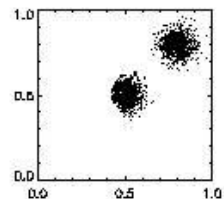
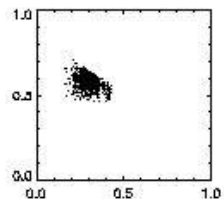
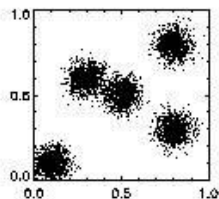
class 4

class 5

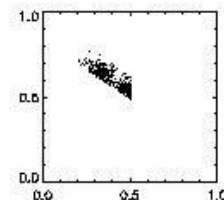
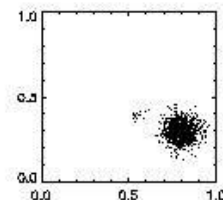
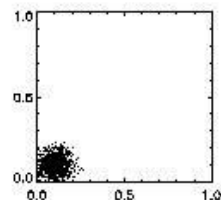
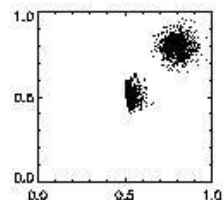
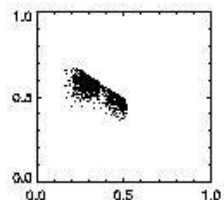
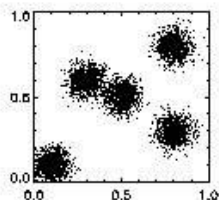
step 1



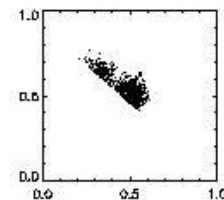
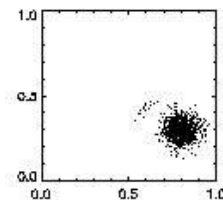
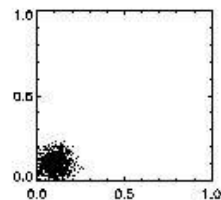
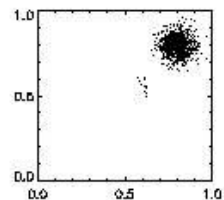
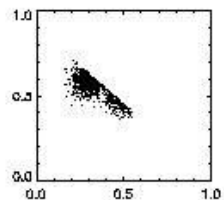
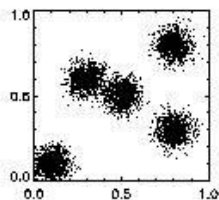
step 2



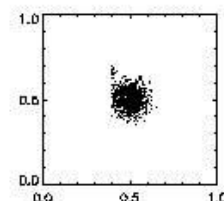
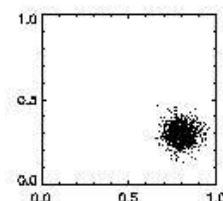
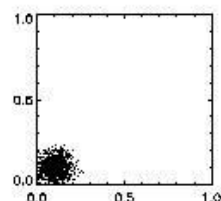
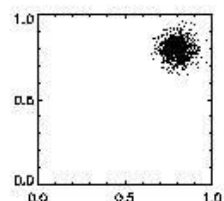
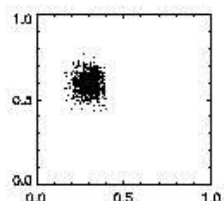
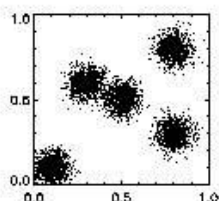
step 3



step 4



step 5



Automatic spectral K-means

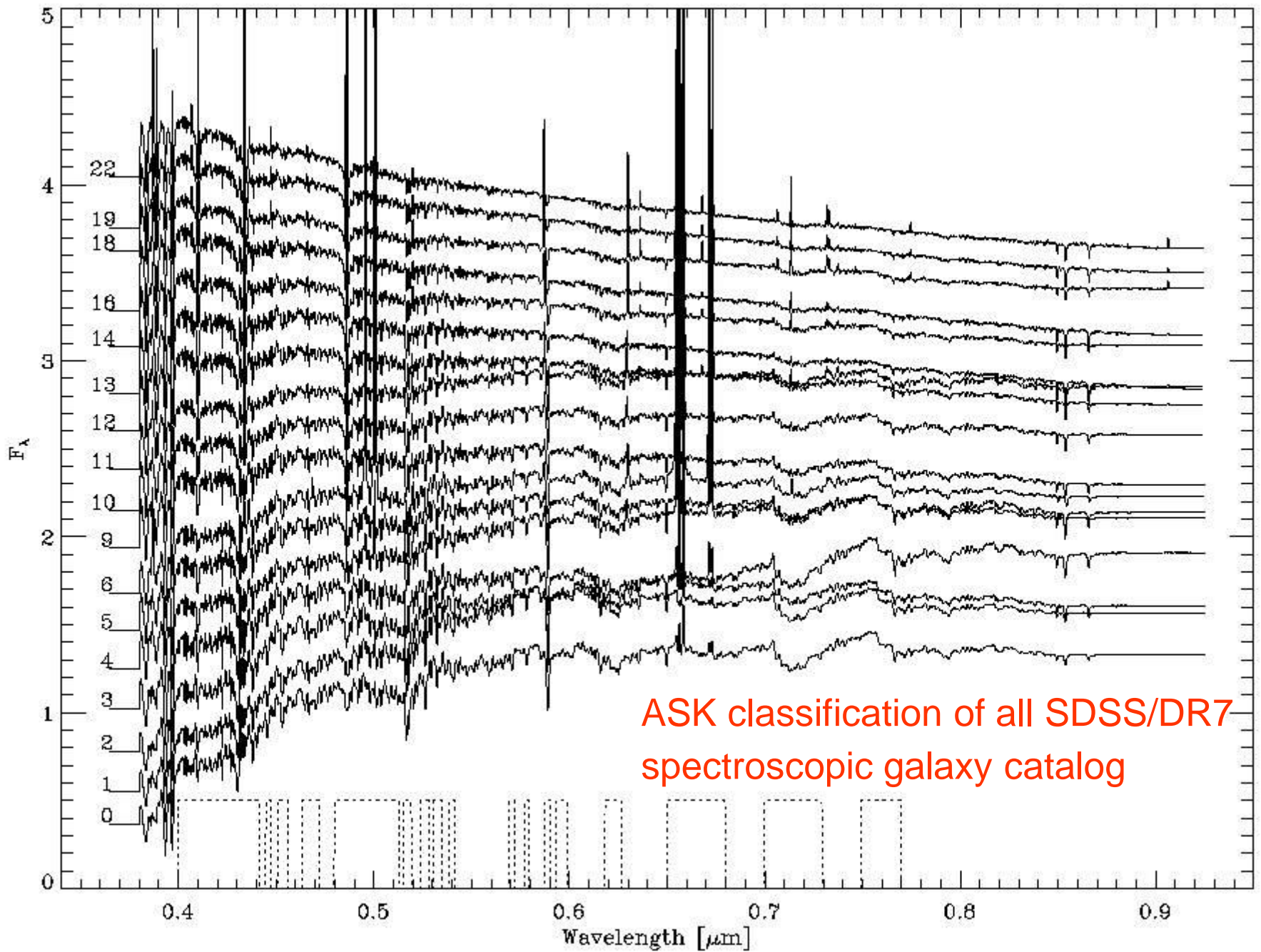
(ASK) classification of the full SDSS/DR7

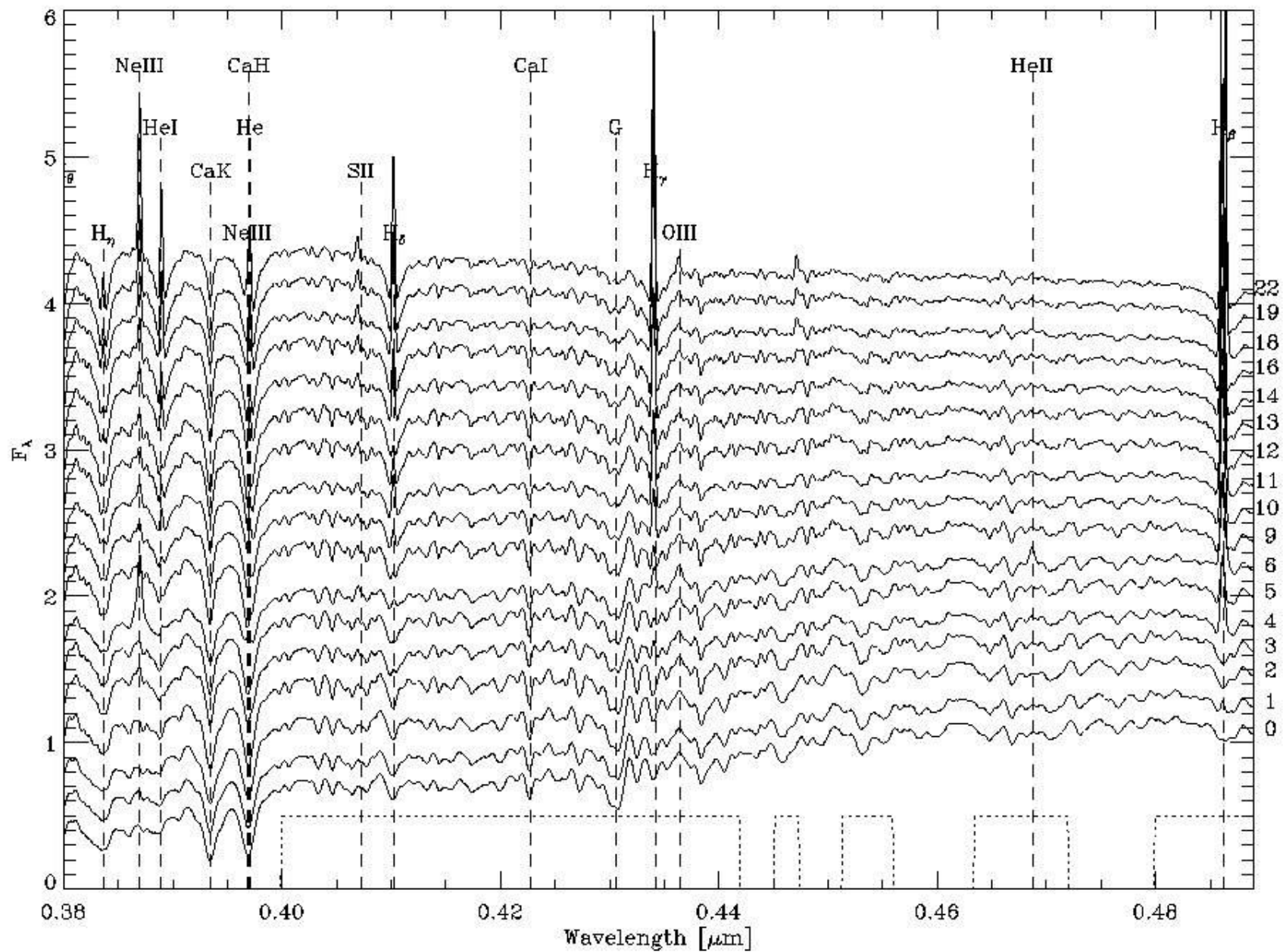
- **It works** for **SDSS/DR7** spectra. 3800 – 9300 Å, ≈ 1.5 Å pixels, selected spectral regions, normalized to the mean flux in the *g*-band.
- **Computationally intensive**: 788677 spectra x 1637 pixels (≈ 11.6 Gb). 50 iterations. 150 initializations.

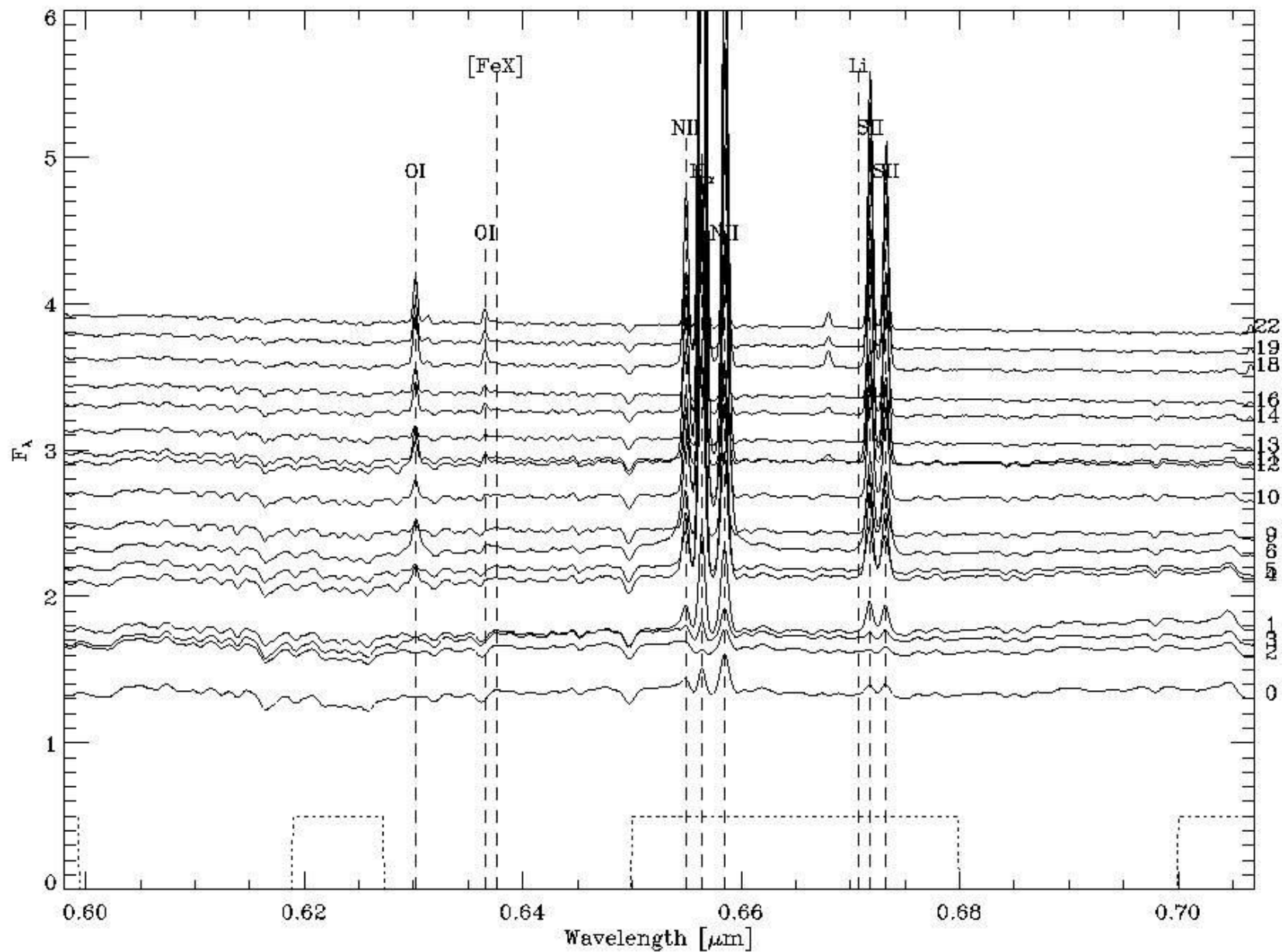
IDL 300 min/ classification (31 days for 150) using a fast 8-core Intel Xenon 2.66GHz 32Gb RAM.

Fortunately the algorithm can be **parallelized**. Fortran MPI **1 hour per 150** initializations using the cluster of 48 Intel Xenon CPUs (2.4 GHz) at IAC (de Vicente).

- 99% of the 788677 galaxies can be assigned to **only 17 major classes**. We order them by ***u-g*** color.



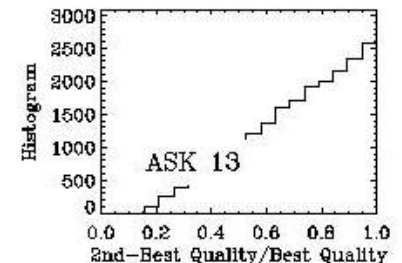
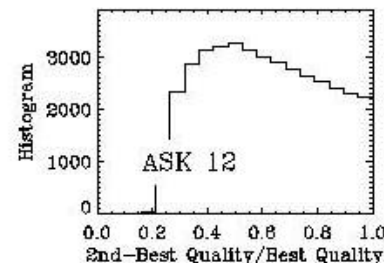
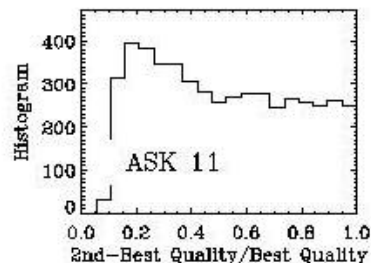
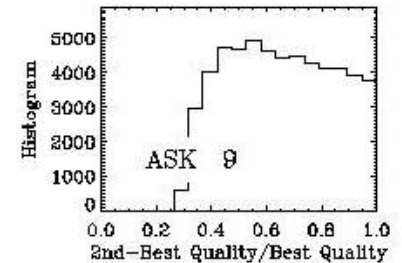
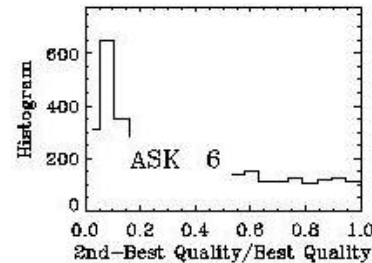
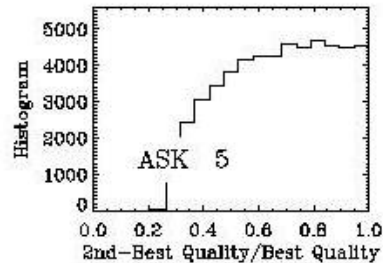
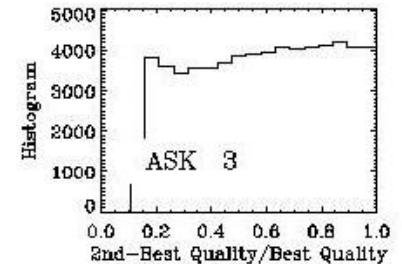
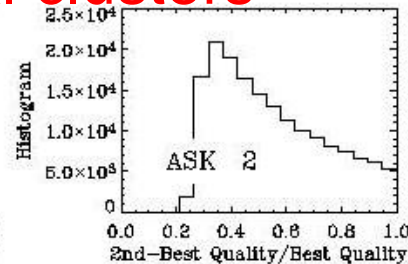
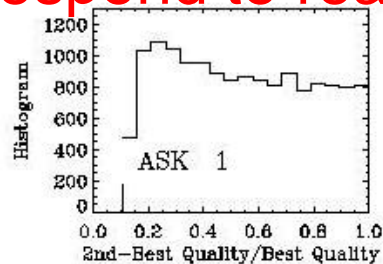




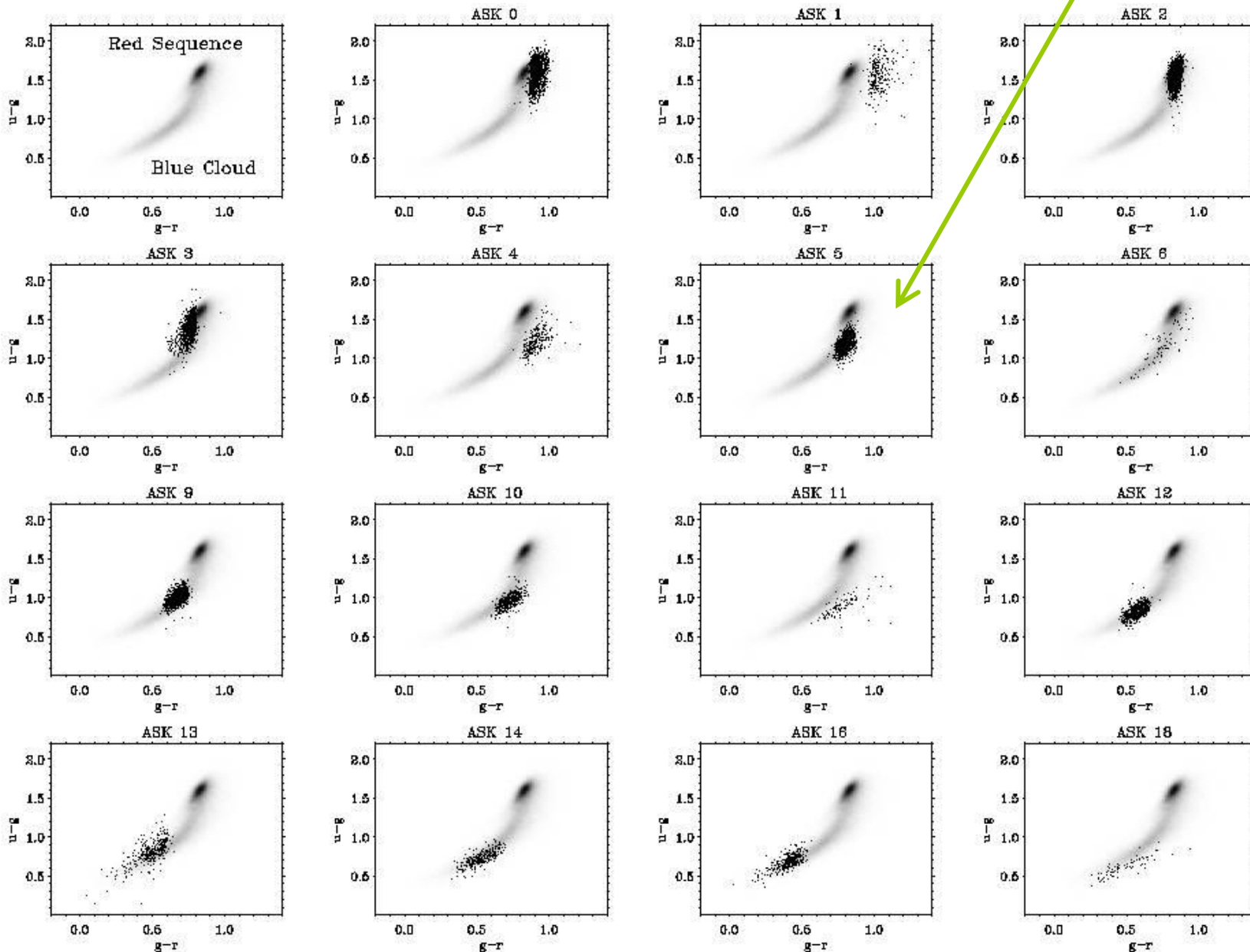
Properties of the ASK classes

Are there true clusters in the classification space?

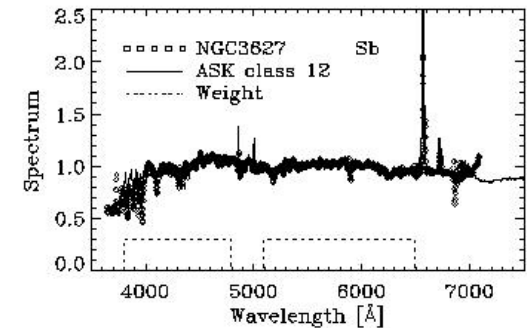
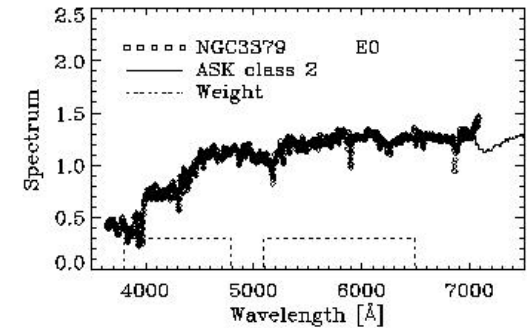
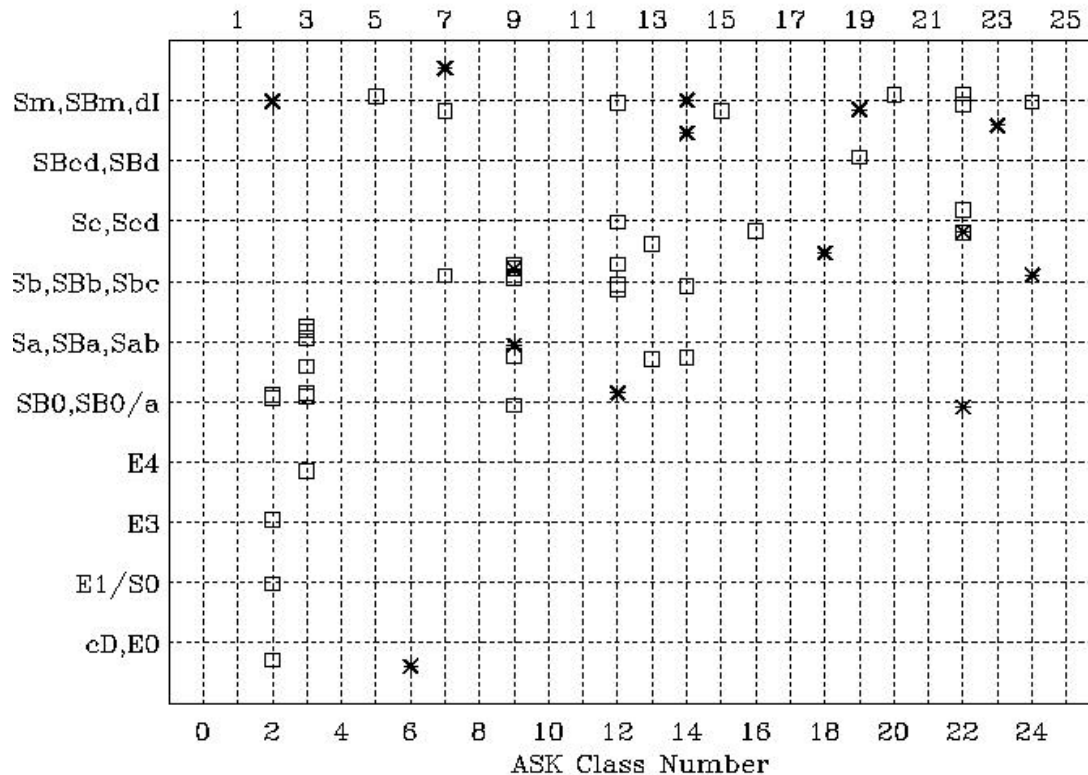
The spectra form a continuum, as judged from the existence of borderline galaxies. However, some of the classes do correspond to real clusters



ASK classes distinguish galaxies in the green valley

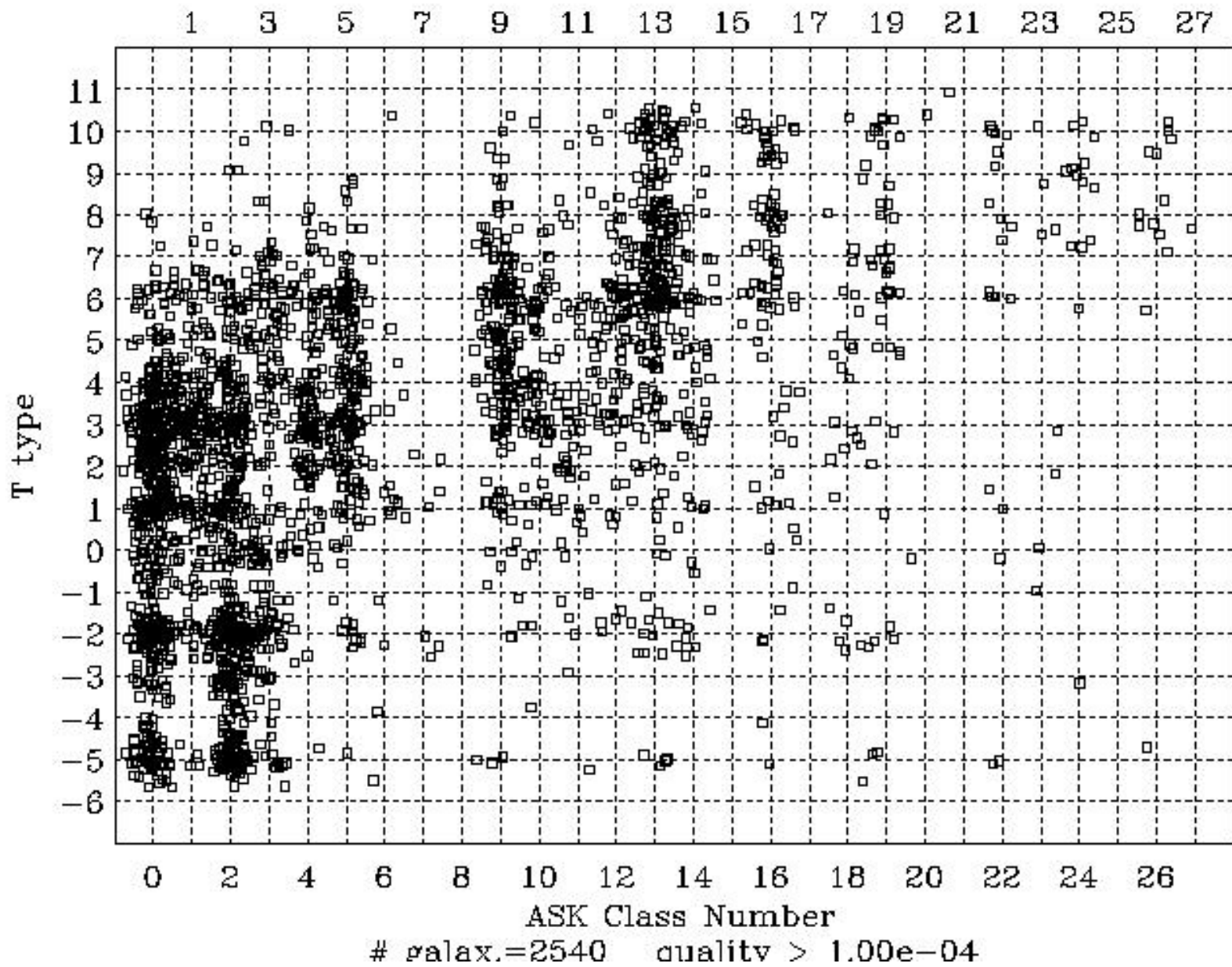


ASK class vs morphological classification



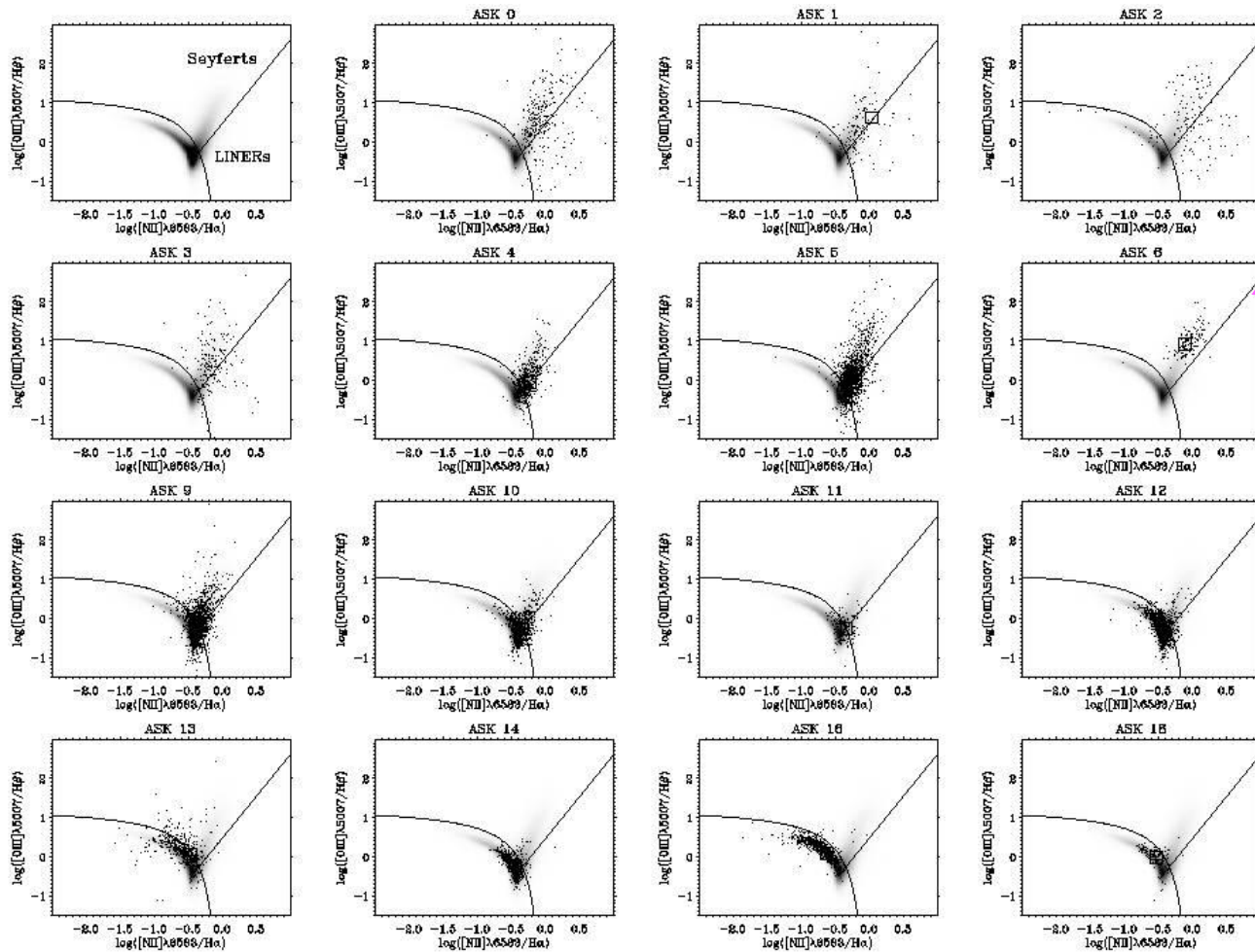
Kennicutt 02

There is a **clear trend** for the **small ASK** numbers (red galaxies) to be associated with the **early-types**, and vice versa. However the relationship presents a **large intrinsic scatter**.



galaxies in the RC3 catalog (de Vaucouleurs et al. 91)

ASK class vs AGN activity



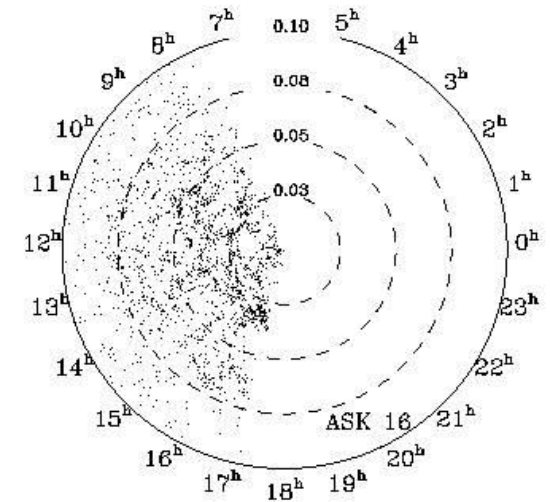
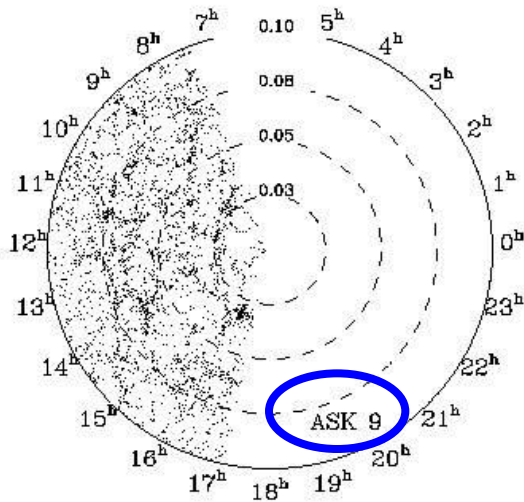
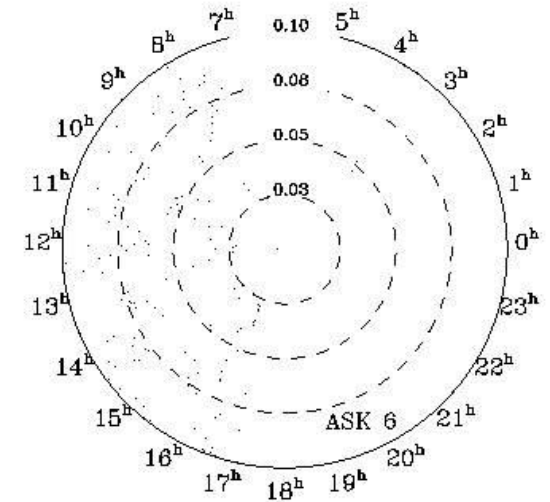
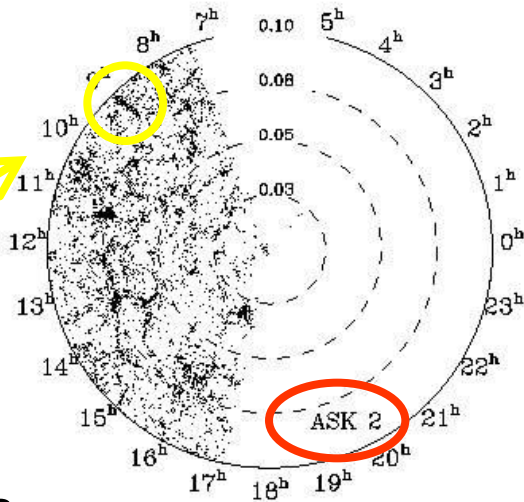
ASK 6, pure Seyfert galaxy

- red galaxies present AGN activity ASK 0,1,2
- green galaxies also present AGN activity ASK 3,4,5,6
- blue galaxies present starburst activity ASK ≥ 7

Cone diagram, redshift < 0.1

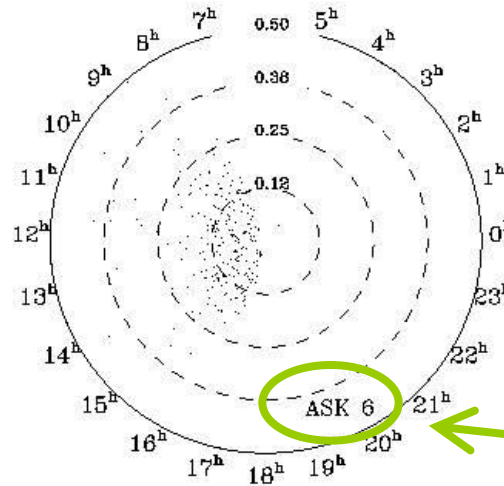
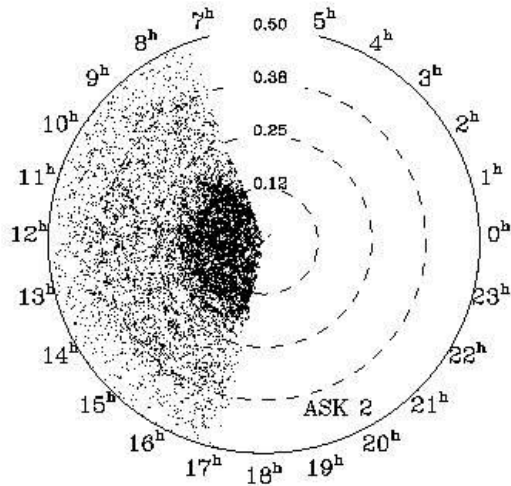
$35^\circ < \text{DEC} < 45^\circ$

Clear *finger of god* effect present **only in red types**, meaning that red galaxies **tend to be in clusters**, whereas blue types are more spread out.



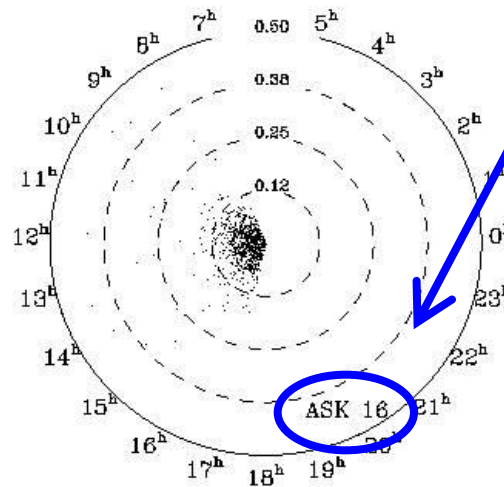
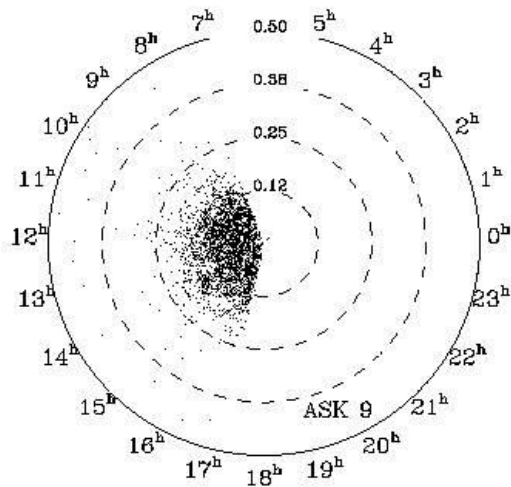
Cone diagram, redshift < 0.5

$35^\circ < \text{DEC} < 45^\circ$



• Seyferts (ASK 6) are spread out.

• Blue types are nearby.



Uses

- ❑ The **classification is freely available** to anyone (**Spanish VO**)
- ❑ **Classification**, meaning, that each class come with a number of **physical properties** that can be assigned to your target galaxy **once its class** is known.
- ❑ Complete template set for **redshift** determination, and galaxy classification. Drawback: limited wavelength range ... but **trivial extension** down to **2500 Å**.
- ❑ **Target Selection**. Green valley galaxies, Seyfert Galaxies,...
- ❑ Trivial extension to **stellar spectra** (work in under way)
- ❑ (New) **specific classifications** focused on a particular spectral features (e.g., low metal targets, double AGN, A.B. Morales Luis will talk about one of these applications)

Conclusions

- ❖ Developed an **unsupervised classification** method for **galaxy spectra** (ASK)
- ❖ Classify the some **930000** galaxies in the final data release of Sloan into **only 17** major **classes** (SDSS/DR7) .
- ❖ Publically available.
- ❖ With many potential applications, from **templates** for **redshift** determinations to **target selection**; see AB's talk!



Flammarion woodcut

u r b i et o r b i

