# Statistical Studies of Galaxy Properties

Karina Caputi

Formation and Evolution of Galaxies 2023-2024 Q1 Rijksuniversiteit Groningen

# Studying galaxy populations at different redshifts

Statistical studies Collective galaxy properties





Blank patches of the sky contain thousands/millions of galaxies

# **Colour-colour diagrams**

# Even the most basic parameters of large galaxy samples contains very valuable information!



Baldry et al. (2004)

# **Counting Galaxies - the Galaxy Luminosity Function (GLF)**

Just as distribution of stellar luminosities reflects physics of star formation and stellar structure, we might hope to learn about galactic evolutionary processes by studying the distribution of galaxy luminosities.

The galaxy luminosity function  $\Phi(M)$ ,  $\Phi(M)$ dM is the number of galaxies that have absolute magnitudes in the range (M, M+dM):

$$\int_{-\infty}^{\infty} \Phi(M) dM = \nu$$

where v is the total number of galaxies per unit volume

The <u>field galaxy luminosity function</u> involves measuring apparent magnitudes of all the galaxies in some representative sample. Individual brightnesses are converted to absolute magnitudes by estimating distances usually by applying Hubble's law to their observed redshifts.

# **GLF - schematic view**



Driver 2004 PASA, 21, 344

# **GLF - the Schechter function**

In an attempt to find a general analytic fit to galactic luminosity functions, Schechter (1976) proposed the functional form:

$$\phi(L) \ dL \sim L^{\alpha} \ e^{-L/L^*} dL$$

which can also be written (in terms of absolute magnitudes):

$$\phi(M) \ dM \sim 10^{-0.4(\alpha+1)M} \ e^{-10^{0.4(M^*-M)}} dM$$

A power law with a high luminosity exponential cut-off

In both forms  $\alpha$  (the slope of the power-law at low luminosities) and L<sup>\*</sup> (the break luminosity) are free parameters that are used to obtain best fit to available data.

Local:  $\alpha$ = -1.0 and M<sup>\*</sup><sub>B</sub> = -21 Virgo:  $\alpha$ = -1.24 and M<sup>\*</sup><sub>B</sub> = -21 ± 0.7

i.e., this is NOT a universal (luminosity) function. It seems to depend upon environment (and redshift).

## The local GLF at optical wavelengths - early determinations



Blanton et al. (2001)

# The GLF: a double Schechter function



More recent computations of the GLF indicate that it follows a double Schechter function up to at least z=1 (dip cannot be reproduced with single Schechter)

Baldry et al. (2011)

# **GLF computation: the Vmax method**

bin all the galaxies in the survey in luminosity and redshift



# **GLF computation: the Vmax method**

## bin all the galaxies in the survey in luminosity and redshift

- Find the largest distance at which a galaxy with observed abs magnitude M<sub>i</sub> can be found in order to have apparent magnitude equal to the limit of the sample m<sub>lim</sub>
- Volume of the sample corresponding the distance is V<sub>max</sub>. This is the volume available for the galaxy. The galaxy could have been anywhere inside the volume.
- Select all galaxies with abs magnitudes in the range (M,M+dM). An estimate of the luminosity function is



weight factor for each galaxy

# Integrating the GLF

# **Galaxy Counts**



(most galaxies are faint)

Fraction of light (or luminosity) by galaxies/L-bin (luminosity contribution from faint galaxies is small)

# **Contribution of different galaxy types**

LF of cluster & local field broken down into different types

Largest fraction in either environment of all galaxies are dwarfs (dE and Irr). Even though S and E the most prominent in terms of mass and luminosity.

More E in Virgo...

The total luminosity function in either environment is the sum of the individual luminosity functions of each Hubble type.



## From luminosities to stellar masses

- •IMF (initial mass function)  $\Psi(m, t)$ , number of stars formed per unit volume (at t=0); often approximated as a power law:  $\Psi(m) dm = \Psi_0 m^{-\alpha}$
- •LF (luminosity function) currently observed number of stars observed per unit luminosity per unit volume
- •PDMF (present day mass function) number of stars observed today per unit mass per unit volume. This needs to be corrected for the time evolution of the IMF up to the present day,



Kroupa, Tout & Gilmore 1993 MNRAS, 262, 545

# The Galaxy Stellar Mass Function (GSMF)



## The GSMF and cosmic stellar mass density - redshift evolution



Madau & Dickinson (2014) and references therein Large-area surveys: study of local Universe

# 2DF Galaxy Redshift Survey



http://www2.aao.gov.au/~TDFgg/

# Millennium Galaxy Catalogue

#### **Millennium Galaxy Catalogue**

The Millennium Galaxy Catalogue (MGC) is a 37.5 deg<sup>2</sup>, medium-deep, B-band imaging survey obtained with the Wide Field Camera on the INT. The survey region is a long, 35 arcmin wide strip along the equator, covering from 10h 00m to 14h 45m and is fully contained within the regions of both the Two Degree Field Galaxy Redshift Survey (2dFGRS) and the Sloan Digital Sky Survey (SDSS).

There are 144 WFC pointings and each was observed for a single 750 s exposure (example field), resulting in a limiting central surface brightness of 26 mag/arcsec<sup>2</sup>. Object catalogues have been generated from the imaging data using SExtractor (E. Bertin). These provide a robust, well-defined, catalogue of galaxies in the range 13 < B < 24 mag. Thus the MGC represents a new wide-angle galaxy resource which firmly connects the local and distant universe within a single dataset.

To give an impression of the quality and depth of the MGC, this figure shows galaxy images from the Digitized Sky Survey and SDSS alongside the MGC image of the same galaxy. For local (B < 20 mag) galaxies, the data allow the decomposition of galaxies into disks and bulges and hence provide the level of detail necessary to perform meaningful comparisons with both high-redshift observations and theories of galaxy evolution and formation.





1G0

Home

Team

Database

Figures

Publications

Links

MGCz is an AAT/2dF redshift survey of those B < 20 galaxies (10,095 in total) not already observed by either the 2dFGRS or SDSS, in order to provide redshifts for the full B < 20 sample. Additional (mop-up) observations, particularly for lowsurface brightness galaxies, were obtained with Gemini/GMOS, NTT/EMMI, TNG/DOLORES and ANU 2.3m/DBS, resulting in an overall redshift completeness of 96%. The median redshift of this sample is 0.12.

Here are some figures and further explanations describing the survey and a selection of scientific results.

Sep 2006, Joe Liske

http://www.eso.org/~jliske/mgc/

# THE SDSS



The most ambitious survey of the sky ever undertaken.

Imaging survey of 8600 square degrees.

Redshifts of more than 1,000,000 galaxies & QSOs.

Robotic 2.5m telescope - imaging & Spectrscopy

# SLOAN - hardware

The SDSS used a dedicated 2.5-m f/5 modified Ritchey-Chretien altitudeazimuth telescope located at Apache Point Observatory (2788m), New Mexico, USA. It is equipped with two powerful special-purpose instruments. The 120-megapixel camera which can image 1.5 square degrees of sky at a time. A pair of spectrographs fed by optical fibres measured spectra of (and hence distances to) more than 600 galaxies and quasars in a single observation. A custom-designed set of software pipelines kept pace with the enormous data flow from the telescope.



**Imager:** 30 SITe/Tektronix 2048 by 2048 pixel CCDs: r, i, u, z, g filters. Drift scan mode: camera slowly reads CCD as data collected.





**spectrographs:** in a single exposure ~600 spectra of galaxies to the spectroscopic limit of r' ~ 18.2 over the field of the telescope. R~2000,  $\lambda$ 3900-9100Å.





# The Sloan Digital Sky Survey

SDSS has been and continues to be an ambitious and influential survey. Over many years of operations (SDSS-I, 2000-2005; SDSS-II, 2005-2008, SDSS-III, 2008-2014), it obtained deep, multi-colour images covering more than a quarter of the sky and created 3-dimensional maps containing more than 930,000 galaxies and more than 120,000 quasars. SDSS data have been released to the scientific community and can be easily accessed via http://www.sdss.org/

The latest generation of the SDSS (SDSS-IV, 2014-2020) focus is •extending precision cosmological measurements to earlier phase of cosmic history (eBOSS), •expanding its infrared spectroscopic survey of the Galaxy in the northern and southern hemispheres (APOGEE-2) •using the Sloan spectrographs to make spatially resolved maps of individual galaxies (MaNGA).



# Quasars in SDSS

- QSO's are relatively easy to identify
- Point sources
- Colours off the main regions occupied by stars
- Characteristic sequence in colour space as redshift increases
  - need for redder
    bands (i,z) for highredshift objects



For-color diagrams for all stellar objects in 75 deg<sup>2</sup> of SDSS imaging data from run 752, with  $i^* < 20.2$ . The inner parts of the diagrams are burs, linearly spaced in the density of stars in color-color space. The shaded areas on the  $g^* - r^*$  vs.  $r^* - i^*$  and the  $r^* - i^*$  vs.  $i^* - z^*$  diagrams election criteria used to select quasar candidates. The solid line is the median track of simulated quasar colors as a function of redshift (adapted ). The letters "a," "b," "c," and "d" indicate the positions on the locus of median color quasars at z = 3.6, 4.1, 4.6, and 5.0, respectively. Colors med SDSS quasars at z > 3.6 are also plotted on the diagrams.

# SLOAN: also stars

- High-latitude fields: easier to probe into halo
- Density of halo stars is very low → need good criteria to isolate objects

10000

9000

8000

7000 Teff 6000

5000

- main sequence turn-off stars
- RR Lyrae on variability
- BHB on colour





#### Belokurov 2013

**Fig. 2.** Stellar tracer selection in the SDSS database. *Left*: Density of stars in the plane of surface gravity logg and effective temperature  $T_{eff}$  for ~180,000 DR8 spectra with 15 < g < 17.5. *Right*: Stars with spectroscopy from the left column are plotted on the plane of u - g and g - r color. **Top**: overview of the sample, darker shades of grey indicate higher density. *Middle*: Selecting the tracers. BH8 (blue), Blue Straggler (violet), MSTO (green) and M-giant (red) stars are chosen in the left column based on their temperature and surface gravity. Density of selected stars is then over-plotted in u - g, g - r space using the same color scheme. **Bottom**: Metallicity distribution in the sample. This show false RGB images (left and right) constructed with 3 grey-scale density distributions of stars picked based on their [*Fe*/*H*]. Red component is for metal-rich stars with -0.75 < [*Fe*/*H*] < -0.75 and blue (metal–poor) -3 < [*Fe*/*H*] < -1.5.

0.5

1.5

2.0

u-g

2.5

3.0

4000

# SLOAN - also stars!

the field of streams



here is a map of individual stars seen in SDSS field of view - colour coded by distance. Sagittarius stream is very prominent. Also many new very faint galaxies found - called "ultra-faint" galaxies.

Belokurov et al. 2007 ApJ, 658, 337



# SLOAN - Systematic characterisation of galaxies



#### huge survey

With the large samples from SDSS and 2dF Galaxy Survey a more quantitative approach to galaxy classification had to be developed, driven by the need to analyse huge samples automatically. What is lost in the detail is more than made up by the HUGE statistics of galaxies of different properties.

The early Sloan releases created samples of  $\sim$ 200 000 galaxies. There are more than 1 million galaxies in the sample, and the results from photometry have changed substantially the picture with the smaller sample.

The latest releases focus more on spectroscopy

# DID THE SDSS FIND ANYTHING NEW?

The low-z universe has been well studied up through the years - was there anything new to be found?

Tully-Fisher Faber-Jackson Luminosity functions Mg<sub>2</sub>-σ Colour-Magnitude etc.

### Yes!

Main progress areas:

✓ Well-understood selection function allows the construction of distribution functions.
 ✓ The vastness of the sample provides large samples of extreme objects.
 ✓ Well-known trends can be studied with very high

precision.

# **Bi-model Colour Distribution**

# a M<sub>0.1j</sub> b

#### red most luminous



Baldry et al. 2004 ApJ, 600, 681

blue dominate faint magnitudes

![](_page_30_Figure_0.jpeg)

# **New Perspectives**

The advent of huge surveys like sloan, and 2DF have provided the opportunity to automatically quantify the properties of galaxies which in the past relied more upon the eye of the experienced observer

In many ways the blue and red sequences parallels the division into late and early type galaxies.

Statistics allow more detailed statements:

Red sequence contains 20% of galaxies by number, but they contribute 40% of the stellar luminosity density and 60% of the average stellar mass density at the present epoch.

# More recent wide-area galaxy surveys

![](_page_32_Picture_1.jpeg)

![](_page_32_Picture_2.jpeg)

![](_page_32_Figure_3.jpeg)

![](_page_32_Picture_4.jpeg)

Now carries 4MOST (spectrograph)

![](_page_33_Figure_0.jpeg)

The 15,000 deg.<sup>2</sup> Euclid Wide Survey, the 53 deg.<sup>2</sup> Euclid Deep Survey, and the 6 deep auxiliary fields (6.5 deg.<sup>2</sup>) [Mollweide Celestial]

- Euclid Wide Survey region of interest : 16 Kdeg.<sup>2</sup> compliant with a 15 Kdeg.<sup>2</sup> survey
- Euclid Deep Fields : North=20 deg.<sup>2</sup>, Fornax=10 deg.<sup>2</sup>, South=23 deg.<sup>2</sup>

Euclid deep auxiliary fields (GOODSN=0.5, AEGIS=1, COSMOS=2, VVDS=0.5, SXDX=2, CDFS=0.5 deg.<sup>2</sup>)

![](_page_33_Picture_5.jpeg)

Background image: Euclid Consortium / Planck Collaboration / A. Mellinger

Science with galaxy surveys over different areas of the sky

<u>Area:</u> ~ a few sq. arcmin to a few sq. deg

individual galaxy properties; galaxy LF; galaxy SMF

<u>Area:</u> >> a few sq. deg

Observational cosmology; study of rare objects (e.g. QSOs)