

ASTR 505 – Fall 2014

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[www.astro.uvic.ca/~sara/A505.html](http://www.astro.uvic.ca/~sara/A505.html)

- Scope and structure of the course
- Project overview
- Assessment and grading

**Course purpose:** A practical course in galaxy research, based on data mining techniques.

**Course structure:** 6 weeks of lectures and literature discussion, followed by an independent research project.

**Lecture structure:** weekly (up to) 1.5-2 hours of lecture, followed by literature discussions for (up to) 1 hour.

## Course objectives:

- Learn about galaxies!
- Learn about current research in galaxies through literature discussions.
- Learn practical research skills (presentations, science writing, logging your research)
- Learn technical skills (programming, visualization, database management, multi-variate analysis)
- Write a report which could lead to a paper or get a thesis started!

## The details (weeks 1-6): Friday 9am-12pm

Sept 5: Sara Ellison - Intro to large surveys and projects.

Sept 12: Luc Simard – mysql and databases.

Sept 19: Luc Simard – photometric properties of galaxies.

Sept 26: Hossein Teimoorinia – Practical application of artificial neural networks in astronomy

Oct 3: Asa Bluck – data manipulation and visualization.

Oct 10: Sara Ellison – Spectroscopic properties of galaxies.

Lecture attendance is compulsory – if you need to be absent, consult with the lecturer, and let me know.

**Literature discussions:** Take place in the last hour of each lecture. Papers posted to website. Make sure you read and prepare for participating in the discussion (10% of grade)! Preparation can be done as a group.

## The details (week 7+): Friday 11:15am-12:30pm

Once projects are underway, the format changes, and most of your time should be spent on projects. **I strongly recommend you keep a journal.**

The lecture becomes a “group meeting”

Each week, every student will present a short (5-10 min) update on his/her project in the last week. We will all discuss/brainstorm/problem solve and provide feedback and ideas.

In addition, you should meet/skype with your project supervisor at least once per week.

# Projects/supervisors

- The clustering of satellites around active galaxies: do mergers trigger black hole accretion? [Sara](#)
- How do galaxy mergers affect the Fundamental Metallicity Relation? [Sara](#)
- Does nuclear activity affect triggered star formation in galaxy mergers? [Sara](#)
- The galaxy size-mass relation for mergers. [Dave Patton \(Trent\)](#)
- Disk shapes and sizes. [Luc Simard \(HIA\)](#)
- HI gas consumption in different environments. [Sara](#)

**Or your own idea!!**

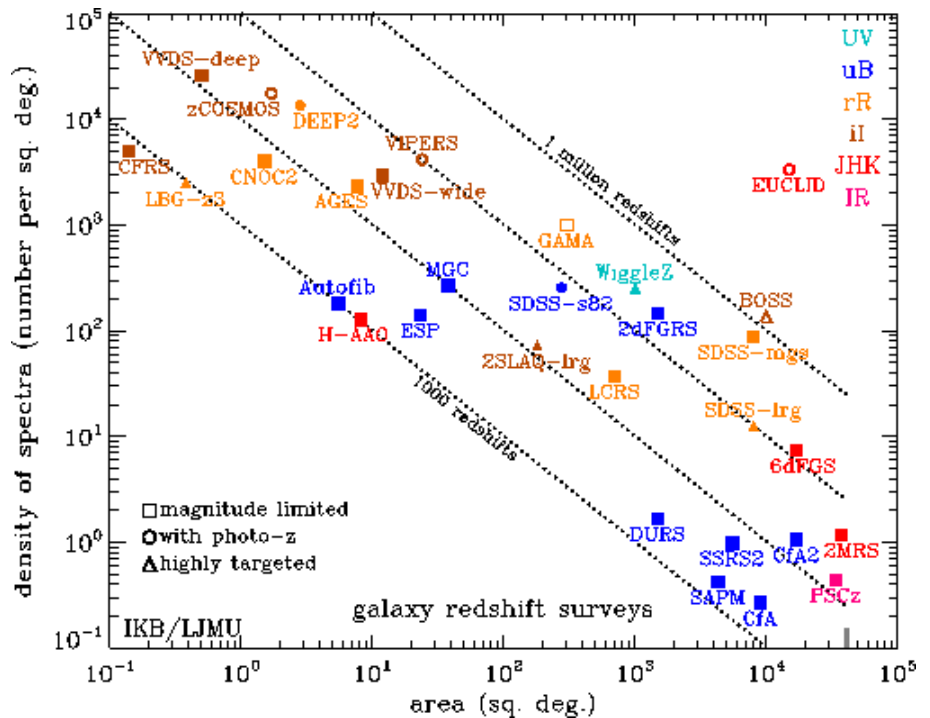
# Assessment

- 10% Contributions to weekly paper discussions
- 10% Contributions to weekly project updates
- 20% project presentation (15 minutes)
- 60% Final project write-up

# We are in the era of large surveys!!

Some technical considerations:

- Single object, masks, fibres:  
Long slit for CfA, masks for CFHT, fibres for SDSS
- Blind versus targeted/  
selection, e.g. ALFALFA vs GASS
- Dedicated telescopes (APO, LSST)
- Depth vs area; bright vs faint

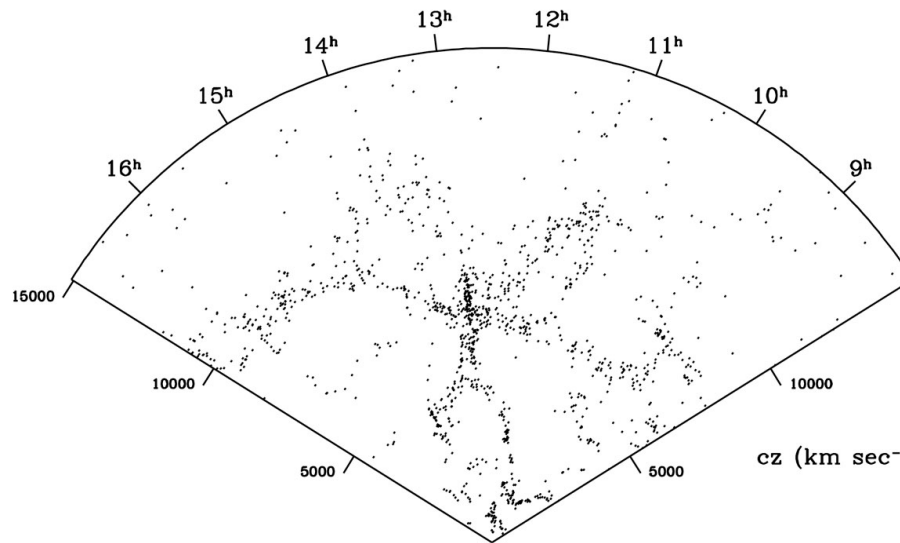


<http://www.astro.ljmu.ac.uk/~ikb/research/galaxy-redshift-surveys.html>

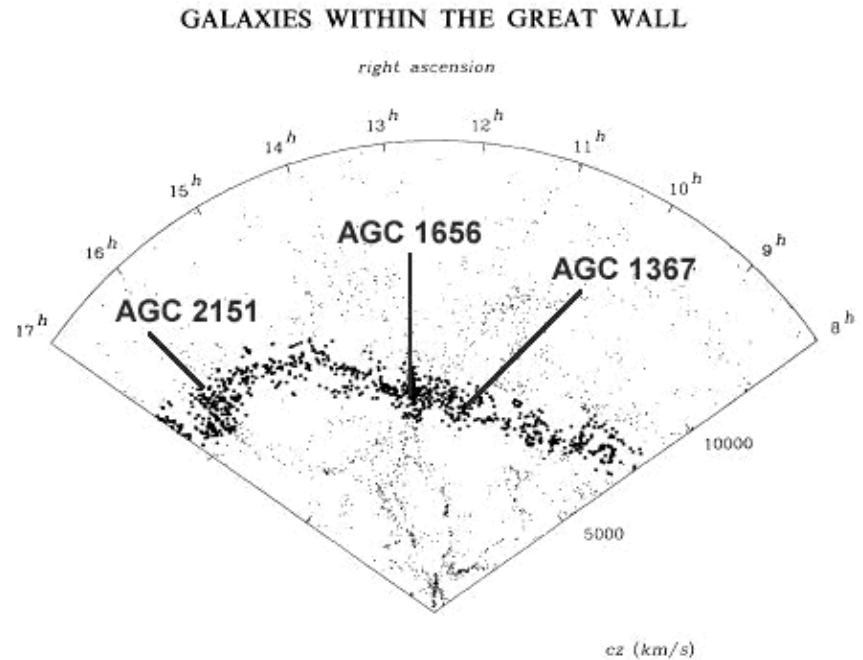


# Some key discoveries by large surveys: $z < 1$

CfA redshift survey (Davis et al. 1982, Huchra et al. 1983) 2400 galaxies,  $z < 0.1$  and CfA2 (Falco et al. 1999) 18,000 galaxies.



1100 galaxies in  
De Lapparent et al. (1986)

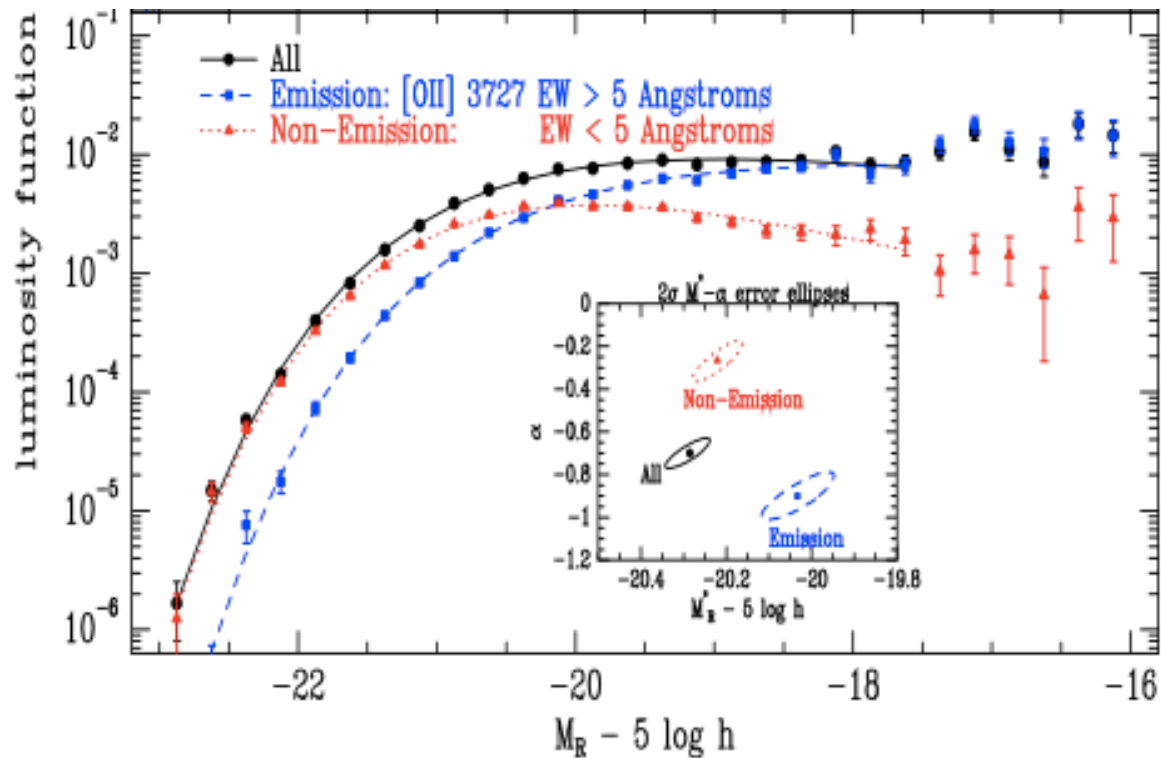


Great wall:  
Geller & Huchra (1989)

<https://www.cfa.harvard.edu/~dfabricant/huchra/zcat/>

# Some key discoveries by large surveys: $z < 1$

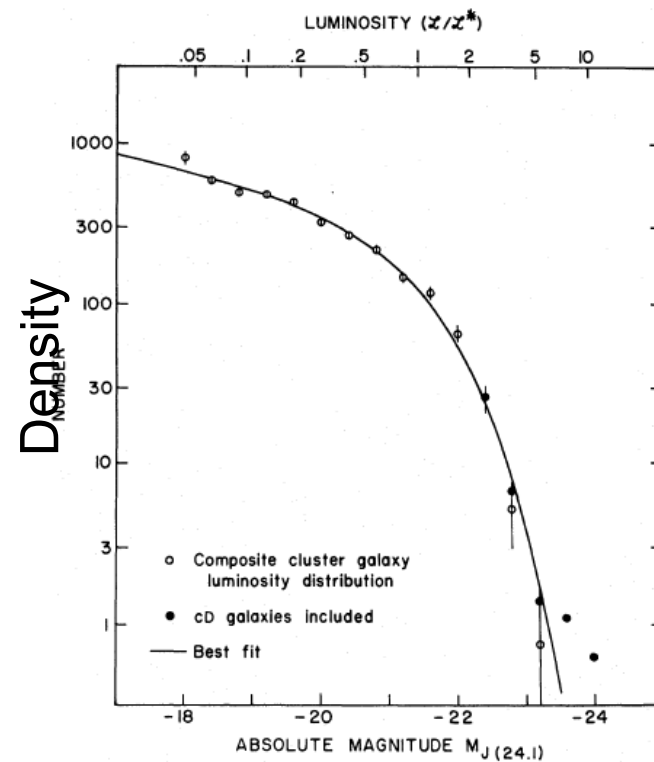
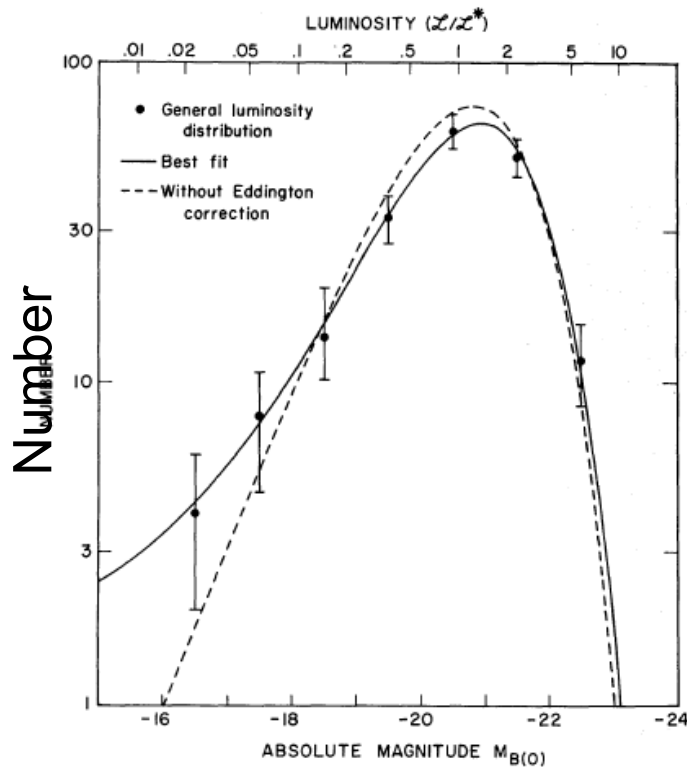
The Las Campanas Redshift Survey (Schectman et al. 1996), 26,000 redshifts at  $z \sim 0.1$  with 2.5-m DuPont.



Emission line galaxies dominate faint end slope: Lin et al. (1996)

# What is this “luminosity function”?

The luminosity function (LF) describes the space density of galaxies per unit luminosity as a function of luminosity.



Schechter 1976

$$\phi(L)dL = \phi^*(L/L^*)^\alpha \exp(-L/L^*)d(L/L^*)$$

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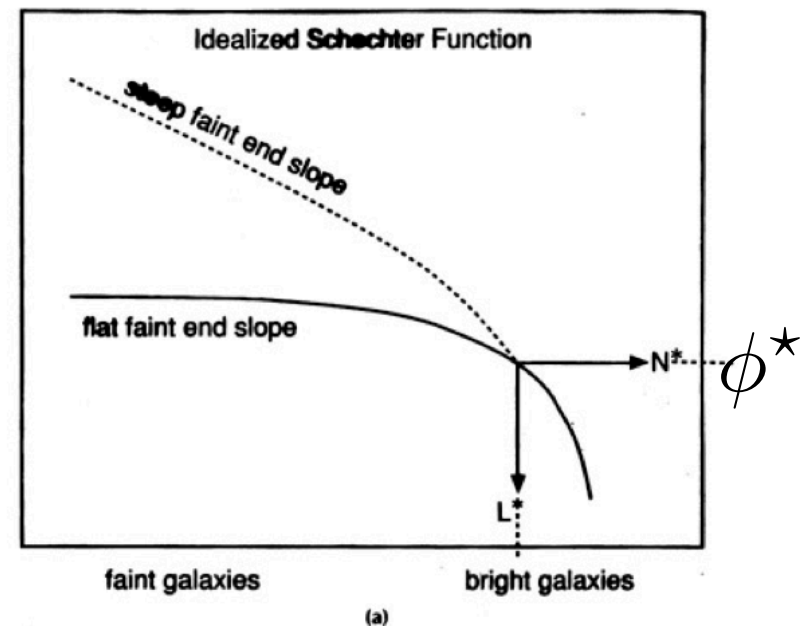
$$\phi(L)dL = \phi^*(L/L^*)^\alpha \exp(-L/L^*)d(L/L^*)$$

$L^*$  = Luminosity that separates high and low luminosity parts (the “knee”)

At low  $L$  ( $L < L^*$ ) galaxies follow a power law (brighter galaxies are rarer:  $\phi \propto L^\alpha$ )

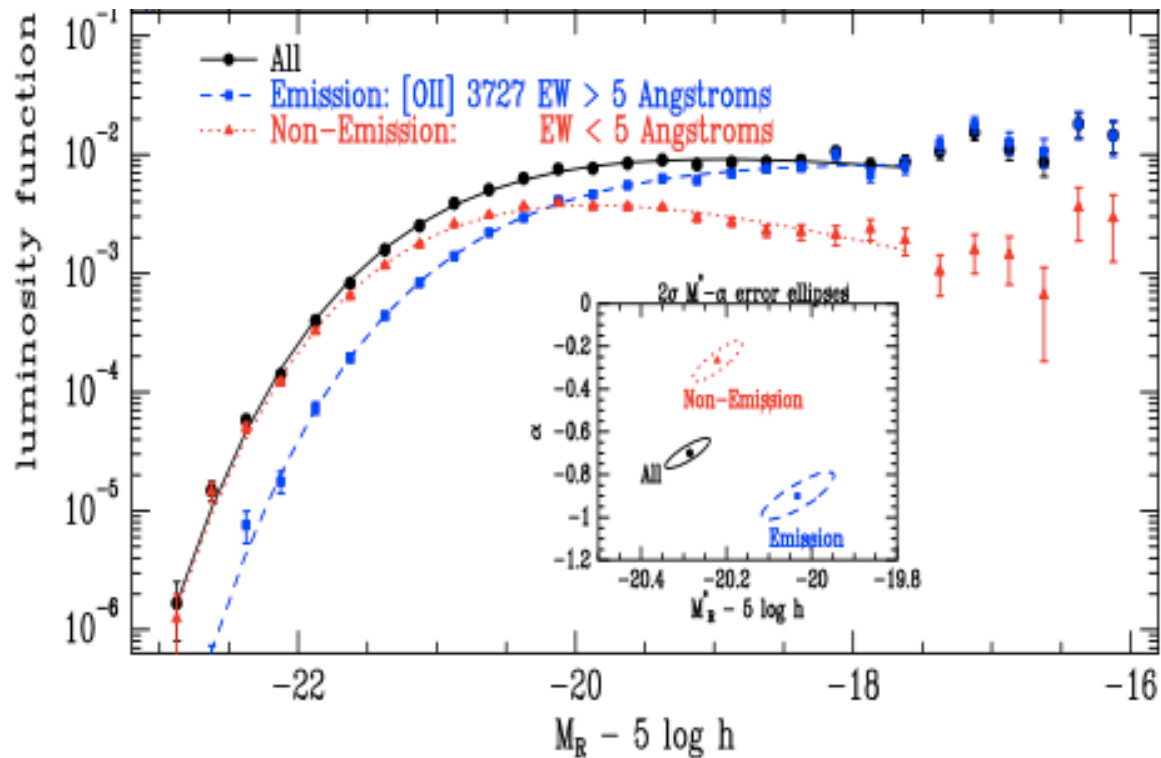
At high  $L$  ( $L > L^*$ ) it is exponential and defines a fall-off (very bright galaxies are very rare:  $\phi \propto e^{-L}$ )

Normalization at  $L^*$  set by  $\phi^*$



# Some key discoveries by large surveys: $z < 1$

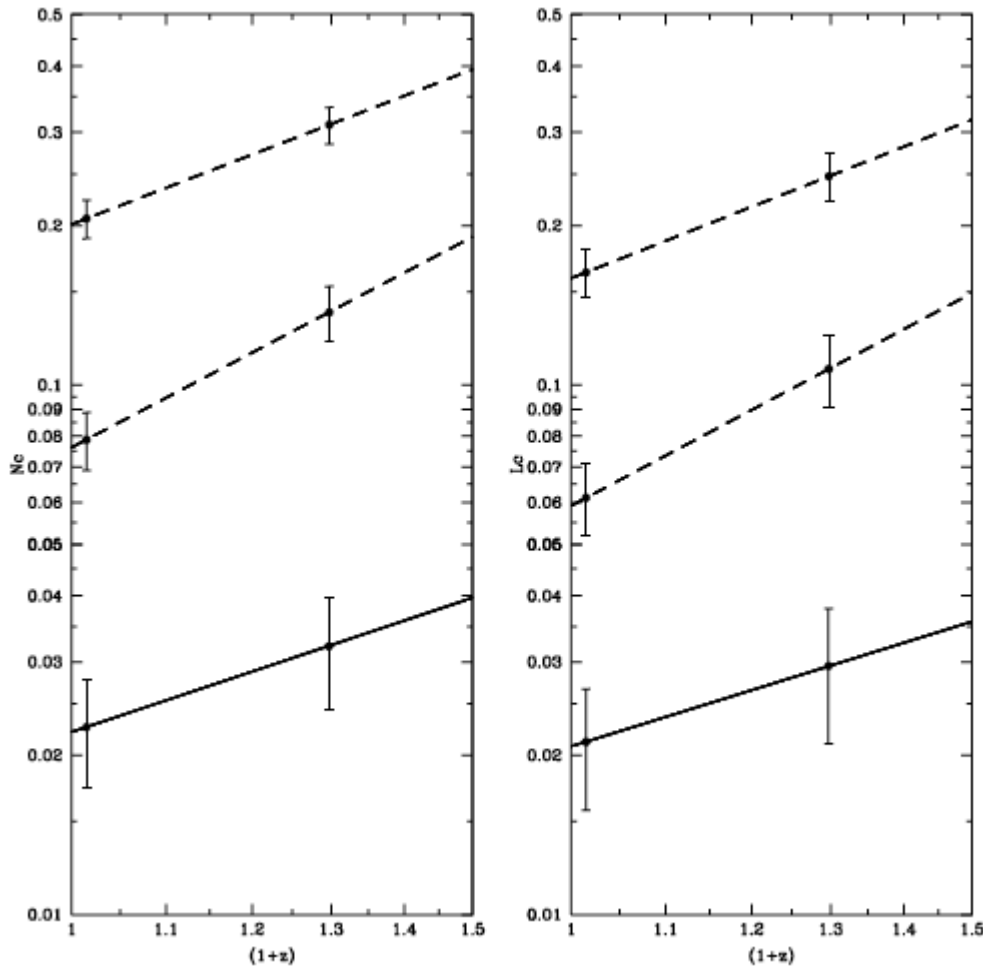
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# Some key discoveries by large surveys: $z < 1$

The CNOC2 survey, (Yee et al. 2000) 6,000 redshifts with CFHT MOS  $z < 0.7$

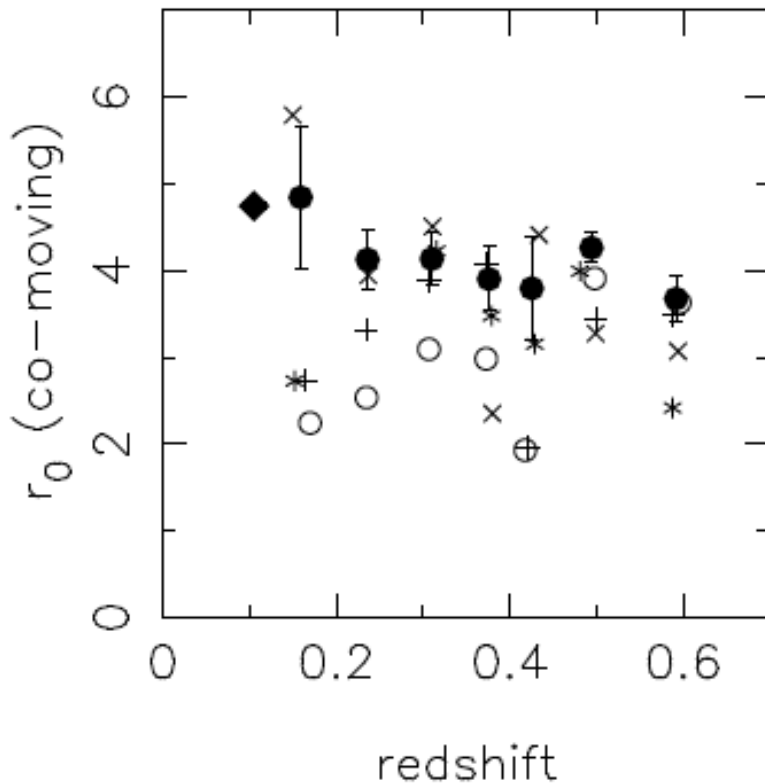


Merger rate evolves like  $(1+z)^{2.3}$  and  $\sim 15\%$  of galaxies have had a major merger since  $z \sim 1$

Patton et al. (2002)

# Some key discoveries by large surveys: $z < 1$

The CNOC2 survey, (Yee et al. 2000) 6,000 redshifts with CFHT MOS  $z < 0.7$



Clustering of galaxies does not significantly evolve with redshift (up to  $z \sim 0.6$ )

Carlberg et al. (2000)

# The two point correlation function, $\xi(r)$

The two-point correlation function describes the excess probability of clustering.

For two small volumes,  $\Delta V_1$  and  $\Delta V_2$  and an average galaxy density of  $n$  galaxies per  $\text{Mpc}^3$ ,

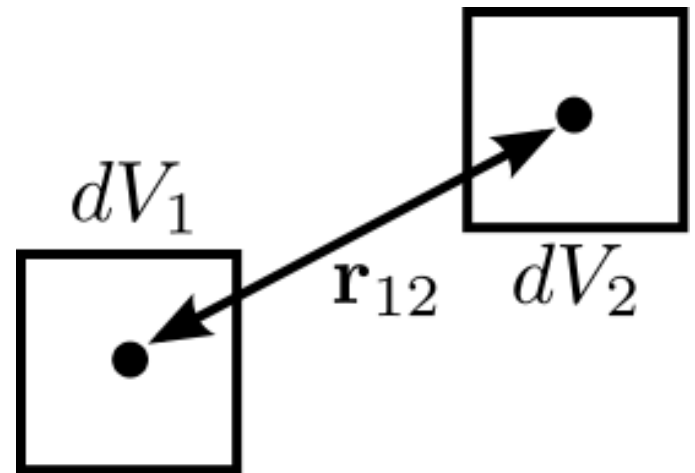
Probability of finding a galaxy in volume 1:

$$\Delta P_1 = n \Delta V_1$$

Probability of having a galaxy in volume 1  
and another in volume 2,

for randomly distributed galaxies:

$$\Delta P_{12} = n^2 \Delta V_1 \Delta V_2$$





# The two point correlation function, $\xi(r)$

But galaxies are not randomly distributed!

Probability of also having a galaxy in volume 2, at distance  $r_{12}$  depends on how clustered the galaxies are. Joint probability of galaxy in  $V_1$  and  $V_2$ :

$$\Delta P = n^2 [1 + \xi(r_{12})] \Delta V_1 \Delta V_2$$

$\xi(r)$  is the correlation function and expresses the excess probability as a function of  $r$ . On scales  $< 10$  Mpc it takes the form  $\xi(r) \sim (r/r_0)^{-\gamma}$ .

If  $\xi(r) > 0$ , galaxies are clustered. If  $\xi(r) < 0$  they avoid each other.

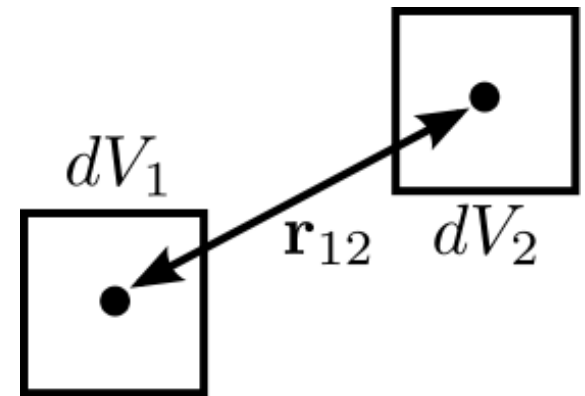
When  $r < r_0$  (the correlation length) the probability of finding a galaxy within  $r$  of another is larger than random.

$\gamma \sim 1.8$  and  $r_0 \sim 5$  Mpc ( $\sim 6$  Mpc for ellipticals which are more strongly clustered).

Also commonly defined are:

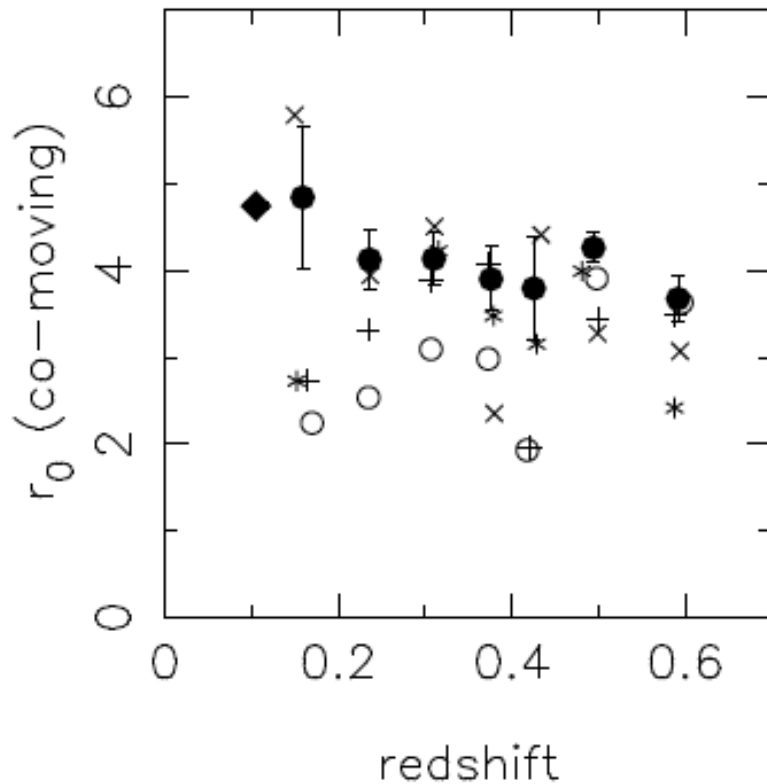
$P(k)$  – the power spectrum, Fourier transform of  $\xi(r)$

$W(\theta)$  – angular correlation function



# Some key discoveries by large surveys: $z < 1$

The CNOC2 survey, (Yee et al. 2000) 6,000 redshifts with CFHT MOS  $z < 0.7$



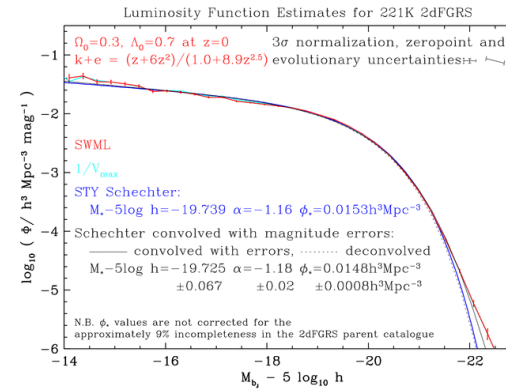
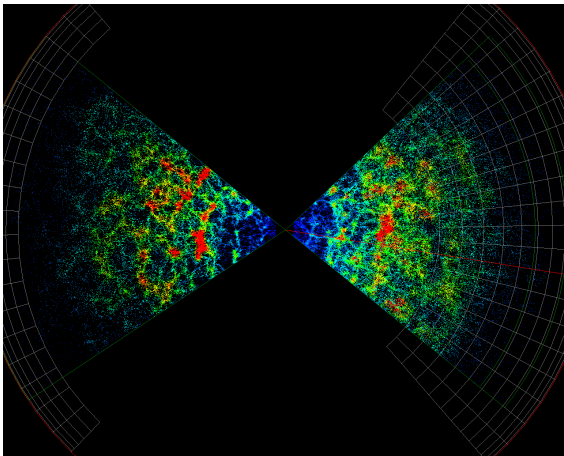
Clustering of galaxies does not significantly evolve with redshift (up to  $z \sim 0.6$ )

Carlberg et al. (2000)

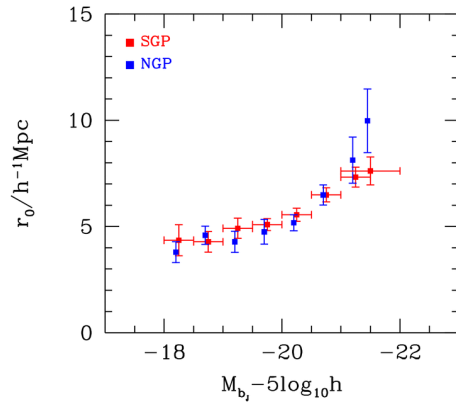
Up until 2000, surveys limited to a few tens of thousands of galaxies.

# Some key discoveries by large surveys: $z < 1$

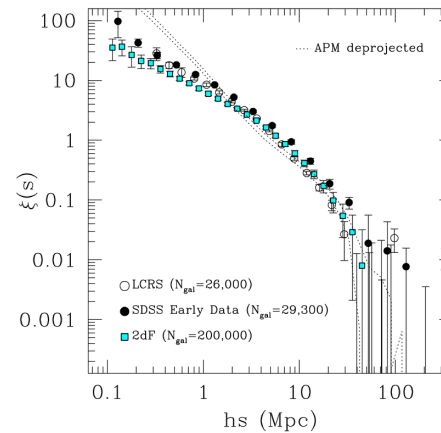
2dF galaxy survey (Colless et al. 2003) 220,000  $z \sim 0.1$  galaxies with AAT.



The 2dF Galaxy Redshift Survey  
Luminosity dependence of galaxy clustering



Norberg et al. (the 2dFGRS team) 2001, astro-ph/0105500

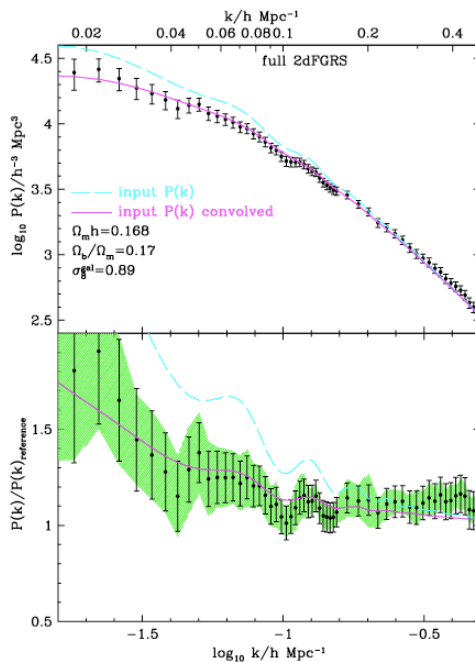


Statistics nailed galaxy parameters!

# Some key discoveries by large surveys: $z < 1$

2dF galaxy survey (Colless et al. 2003) 220,000  $z \sim 0.1$  galaxies with AAT.

Cosmology with galaxy surveys! E.g. Percival et al (2001), Cole et al. (2005)



Measurements of the matter power spectrum can constrain cosmological parameters, such as  $\Omega_M$  and  $\Omega_{\text{lambda}}$ .

This field is known as Baryon Acoustic Oscillations (BAO)

[http://www.astro.uvic.ca/~jwillis/teaching/astr405/astr405\\_lecture6.pdf](http://www.astro.uvic.ca/~jwillis/teaching/astr405/astr405_lecture6.pdf)

<http://astro.berkeley.edu/~mwhite/bao/>

[http://en.wikipedia.org/wiki/Baryon\\_acoustic\\_oscillations](http://en.wikipedia.org/wiki/Baryon_acoustic_oscillations)

A very brief cosmology review!

The expansion of the universe as a function of  $z$  is expressed with the scale factor

$$a(t) = d(t)/d_0 = (1 + z(t))^{-1}$$

The Hubble parameter is then defined as

$$H(t) \equiv \frac{\dot{a}}{a}$$

The density of various components can be expressed as a function of the critical density

$$\rho_c = \frac{3H^2}{8\pi G}$$
$$\Omega_x \equiv \frac{\rho_x}{\rho_c} = \frac{8\pi G \rho_x}{3H^2}$$

The Friedmann equation can be re-written in terms of densities

$$H^2(a) = \left(\frac{\dot{a}}{a}\right)^2 = H_0^2 \left[ \Omega_m a^{-3} + \Omega_r a^{-4} + \Omega_k a^{-2} + \Omega_\Lambda a^{-3(1+w)} \right]$$

**I.e. the rate of expansion is governed by cosmological parameters.**

$H(z)$  can be inferred from “standard rulers”.

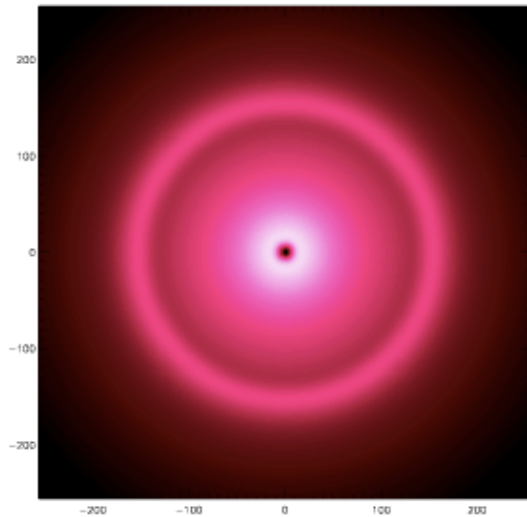
By measuring the subtended angle  $\Delta\theta$  and known length scale  $\Delta\chi$  we map the angular diameter distance as a function of  $z$ :

$$\Delta\theta = \frac{\Delta\chi}{d_A(z)}$$
$$d_A(z) \propto \int_0^z \frac{dz'}{H(z')}$$

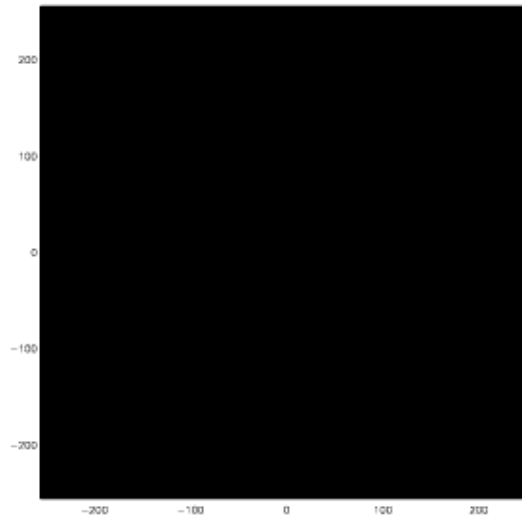
The redshift interval is measured from the data and hence  $H(z)$  can be determined

$$c\Delta z = H(z)\Delta\chi$$

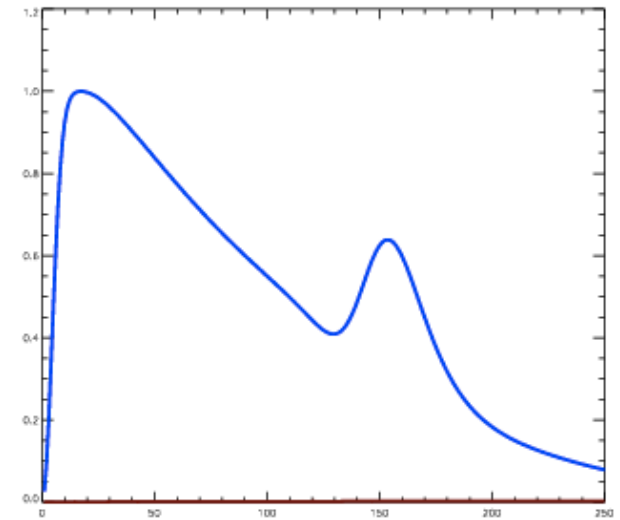
Consider an initial perturbation in the primordial plasma (free protons and electrons, plus photons). Perturbations travel together until recombination, after which the baryons stall (leaving a shell at the sound horizon) and photons free stream.



Baryons

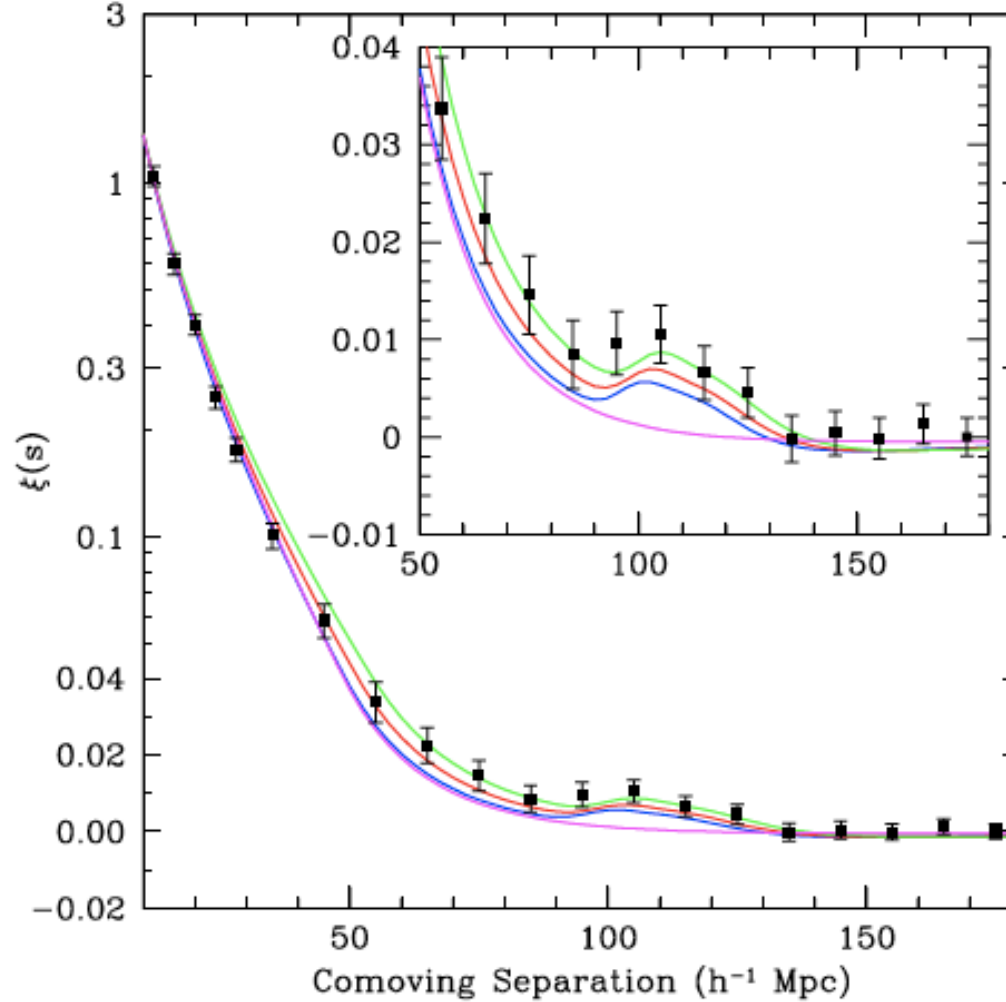


Photons



Baryons fall back in under gravity. Galaxies form at overdensities at centres of these ripples and at sound horizon ( $\sim 100$  Mpc).

The sound horizon is a standard ruler



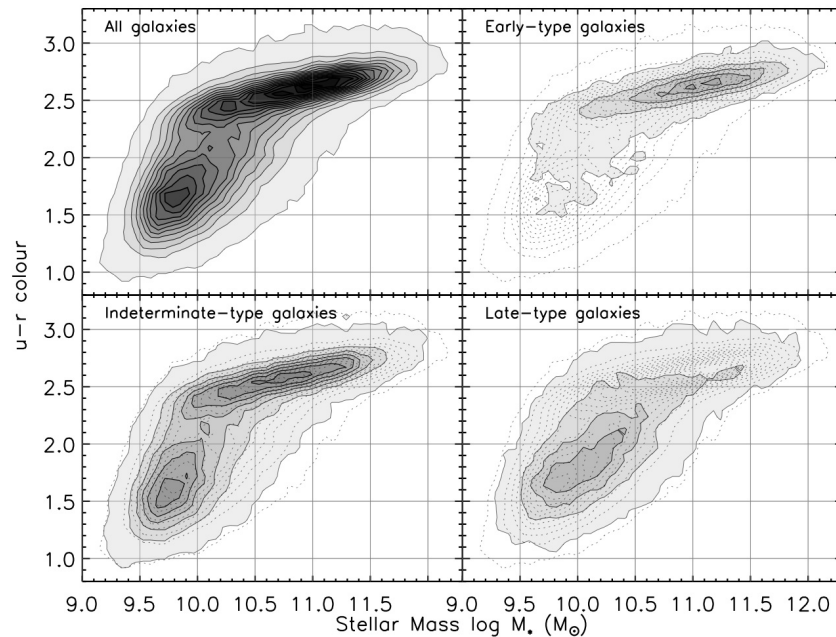
Correlation function of SDSS LRGs from Eisenstein et al. (2005)  
Other important BAO surveys include wigggleZ and BOSS



# Some key discoveries by large surveys: $z < 1$

Sloan Digital Sky Survey (Strauss et al. 2002) 700,000 galaxies at  $z < 0.2$  (plus 100,000 LRGs out to  $z \sim 0.5$ ). Totally public, rather than team.

Beyond LFs and clustering: Detailed properties of galaxies

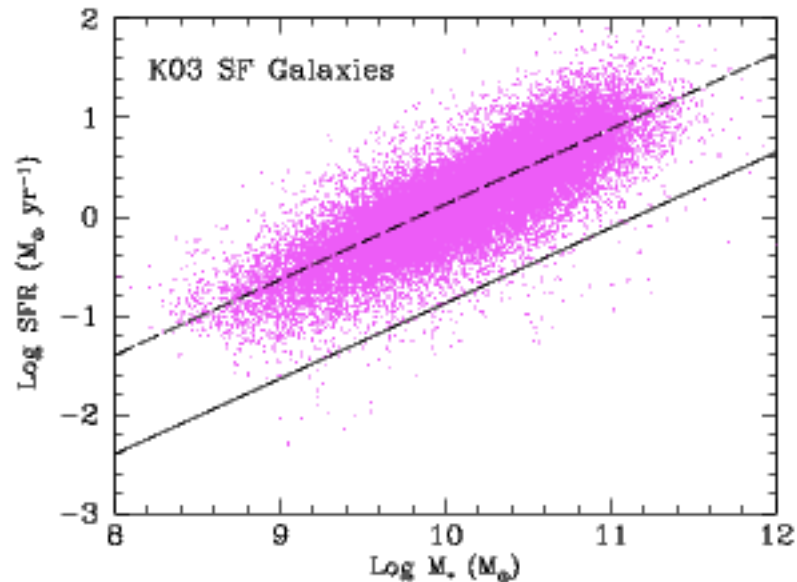


Galaxy bimodality e.g. Strateva et al. (2001)

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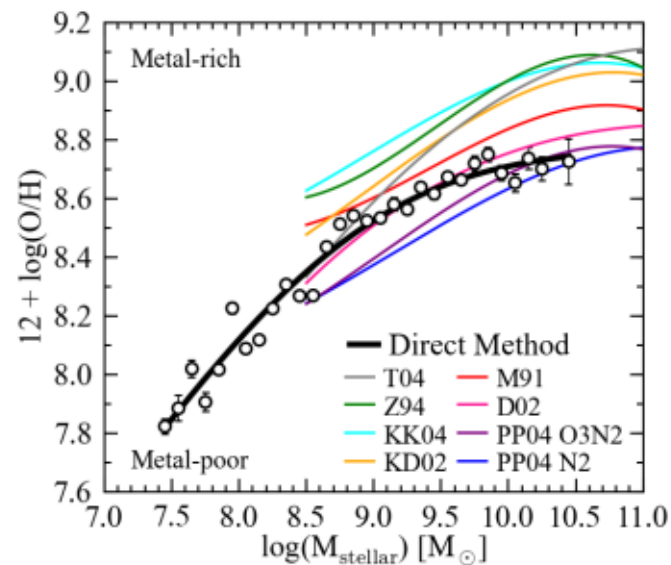


Star formation “main sequence” e.g. Brinchmann et al. (2004)

# Some key discoveries by large surveys: $z < 1$

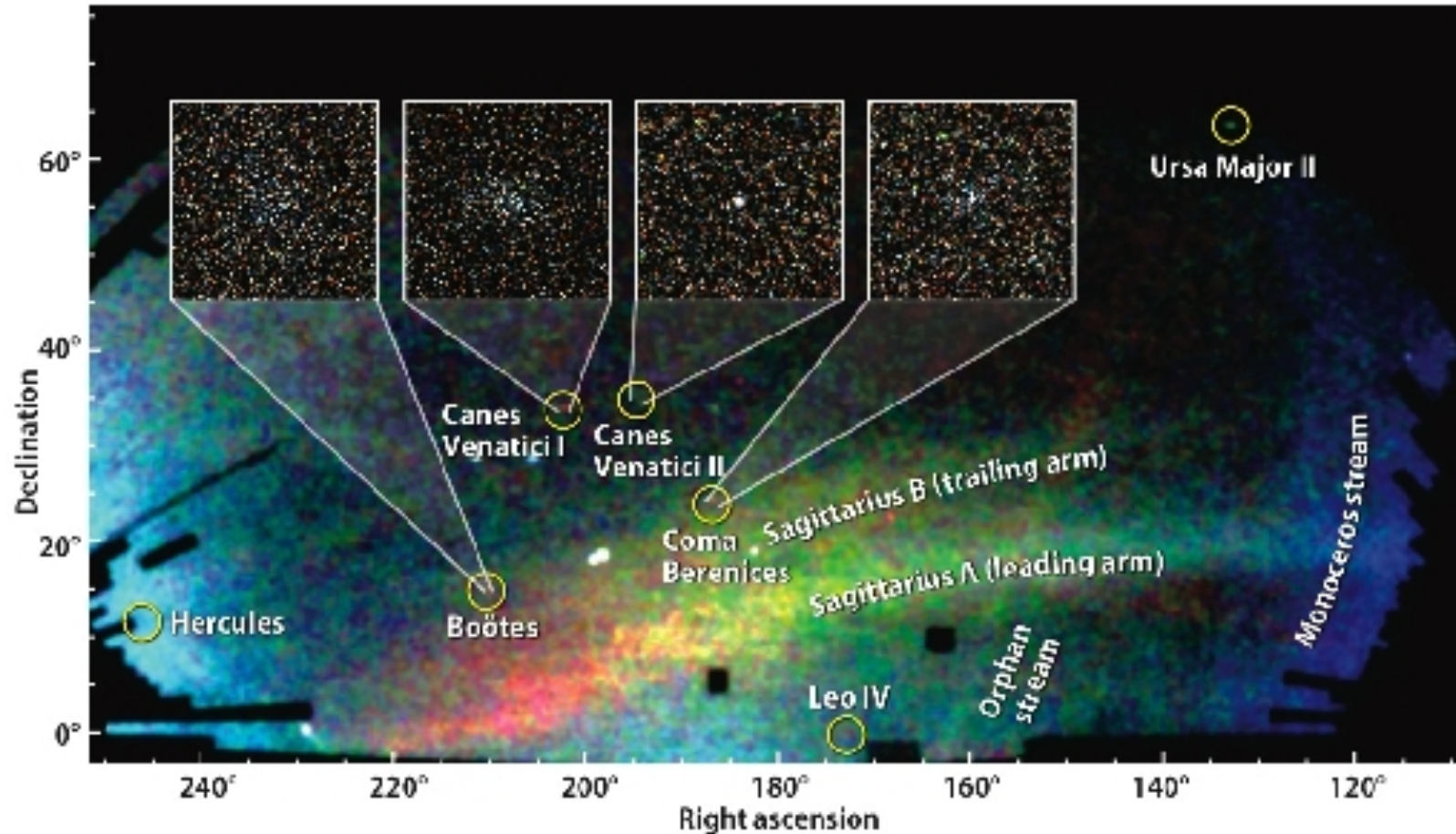
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Beyond LFs and clustering: Detailed properties of galaxies



Mass metallicity relation, e.g. Tremonti et al. (2004)

# Discoveries about our own Galaxy with SEGUE



Many follow-up SDSS surveys: [http://en.wikipedia.org/wiki/Sloan\\_Digital\\_Sky\\_Survey](http://en.wikipedia.org/wiki/Sloan_Digital_Sky_Survey)

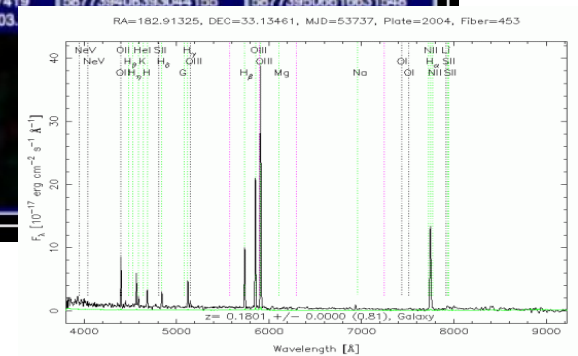
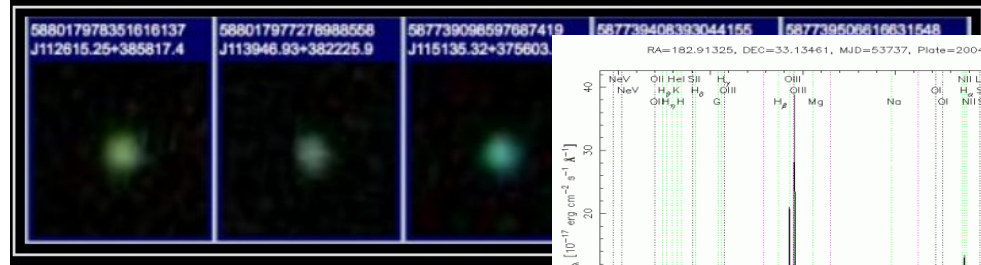
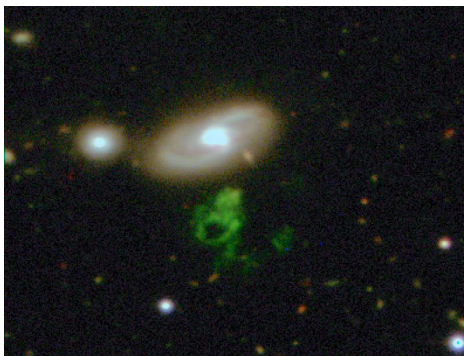
# Citizen Science explosion!

GZ1: 1 million galaxies, 100,000 volunteers, 40 million classifications!

Visual classifications help find the unusual.

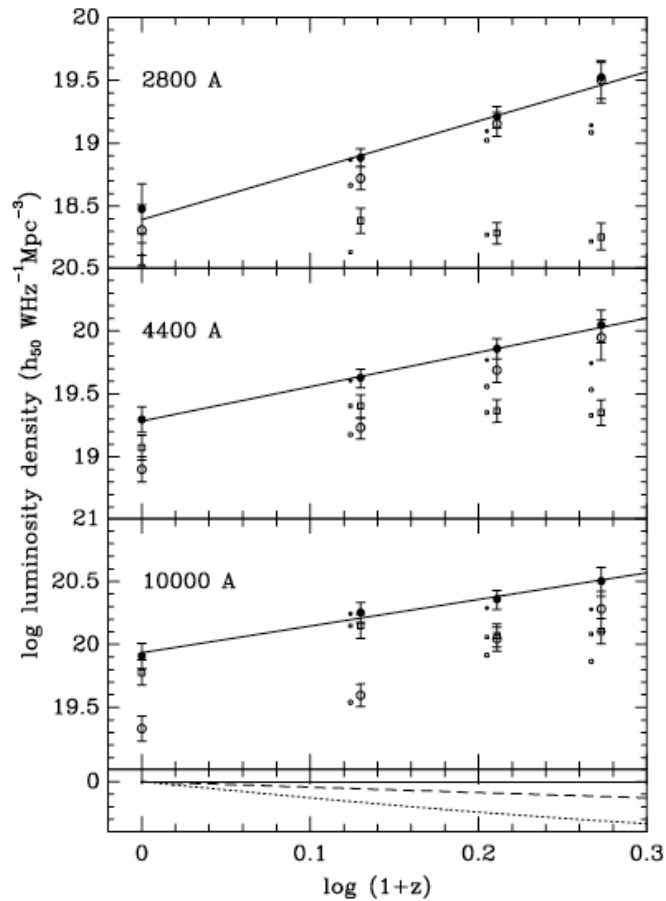


Galaxy mergers, Hanny's voorwerp and green peas!

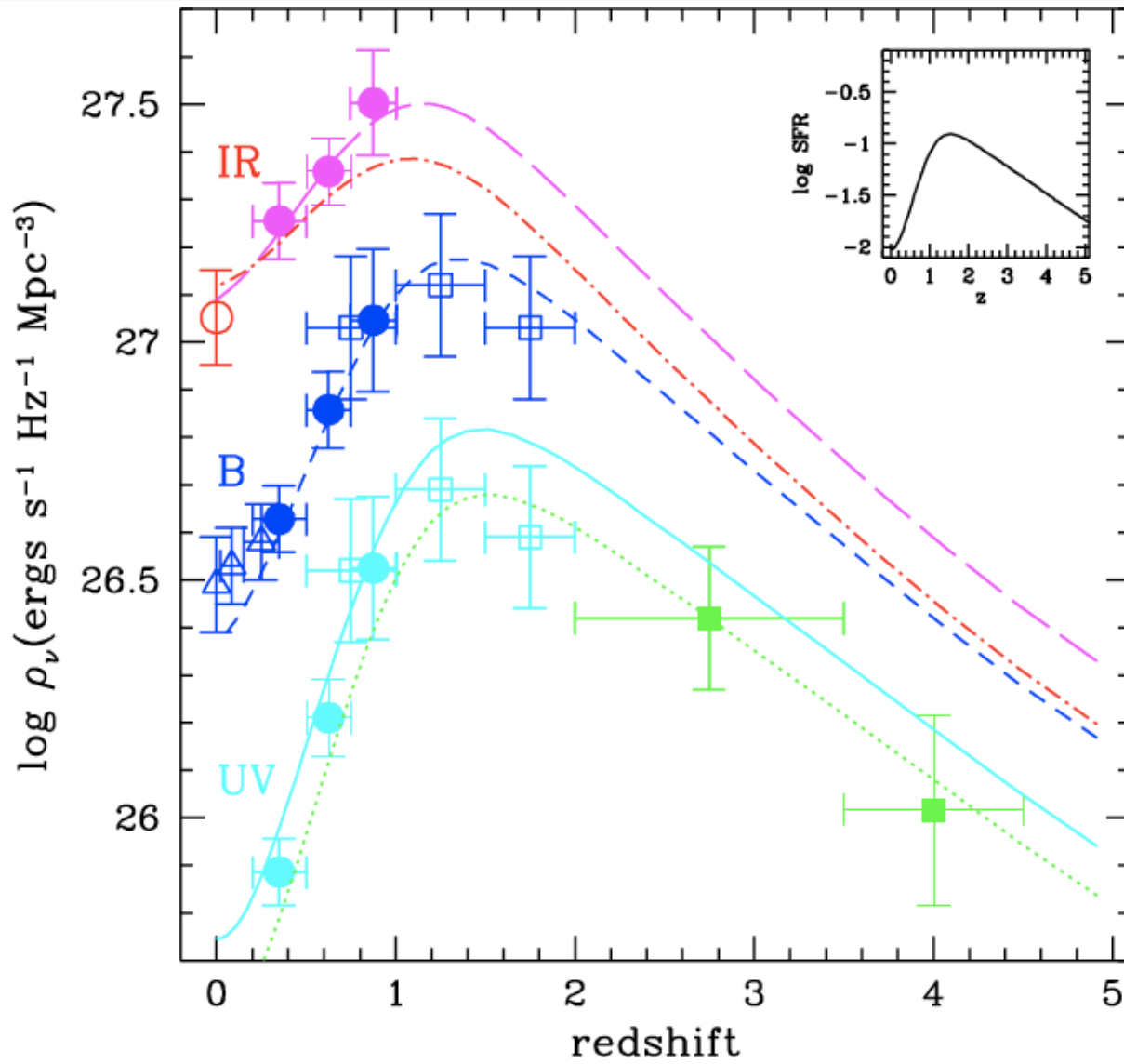


# Some key discoveries by large surveys: high z

The Canada-France Redshift Survey (Lilly et al. 1995), 700 redshifts at  $z < 1.2$  with CFHT



Lilly et al (1996) - evolution in galaxy luminosity density. Pre-cursor to the “Madau plot” of SFR evolution.

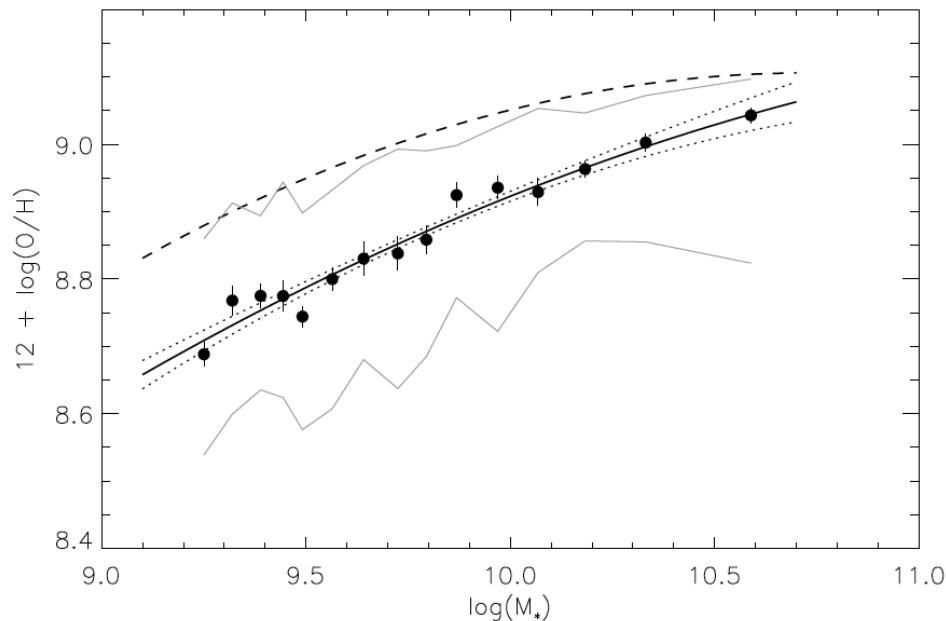


Madau et al. (1998)

# Some key discoveries by large surveys: high z

DEEP2 (Davis et al. 2003) 60,000 galaxies with Keck  $z \sim 1.2$

More than just a redshift survey: Designed to be able to compare properties of  $z \sim 1$  galaxies with SDSS. Large sample of spectroscopically derived quantities e.g. O/H and SFR.

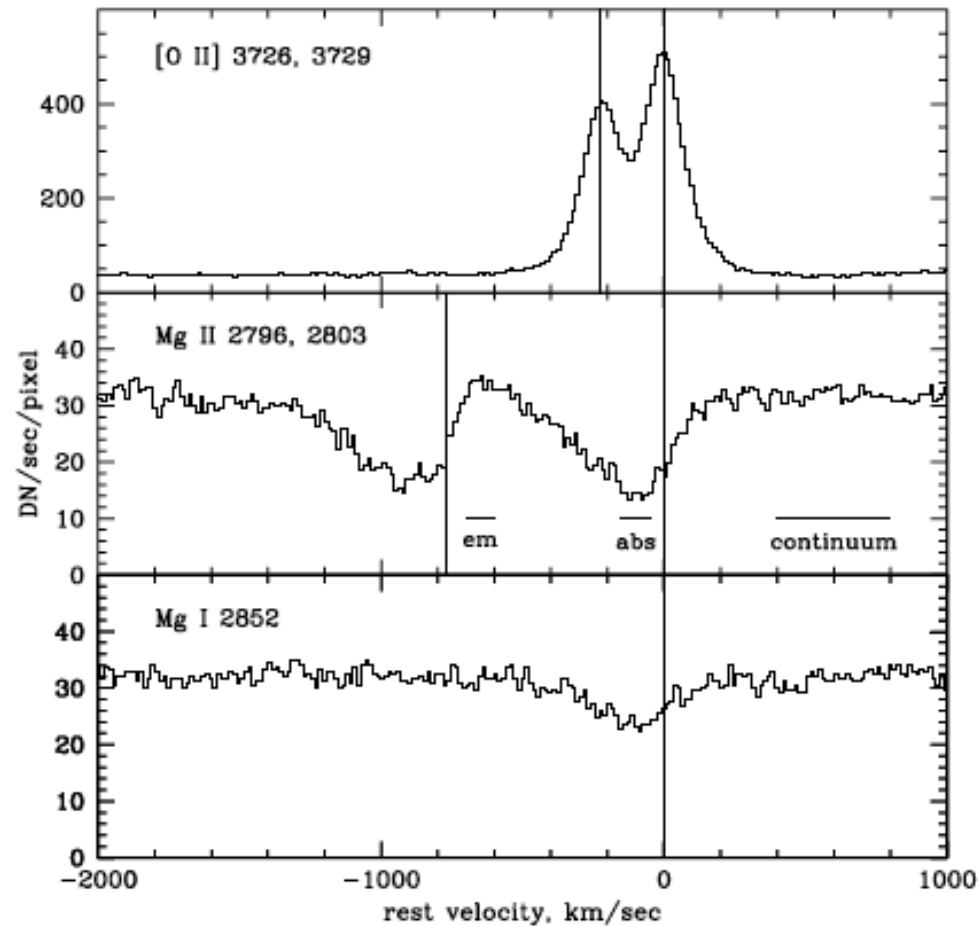


Mass-metallicity relation,  
Zahid et al. (2010)



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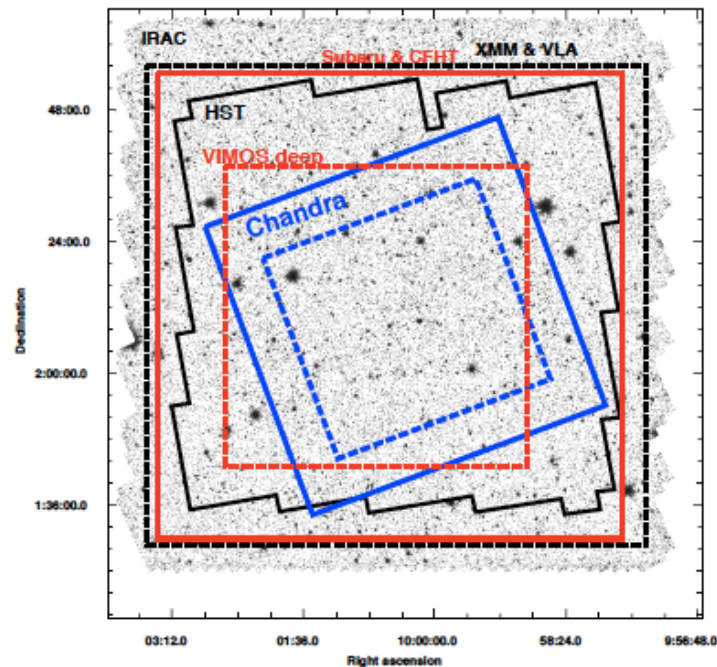
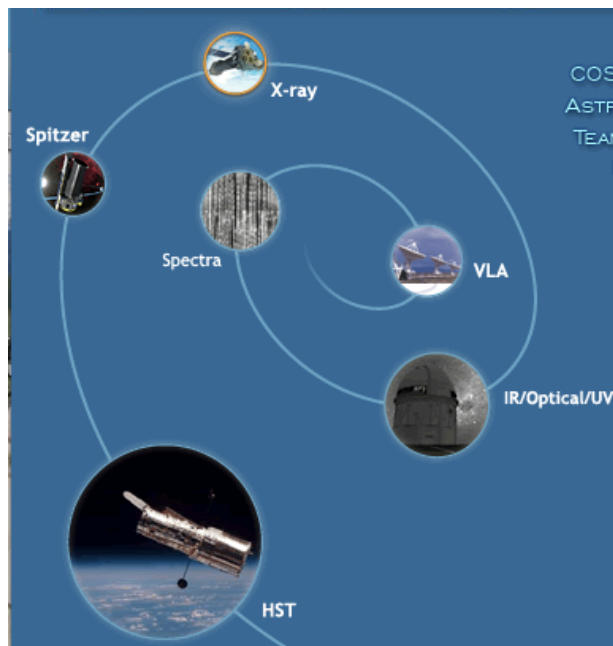


Stacked spectra showed first evidence of outflows in  $z \sim 1$  galaxies. Independent AGN or morphology.

Weiner et al. 2009

# Some key discoveries by large surveys: high z

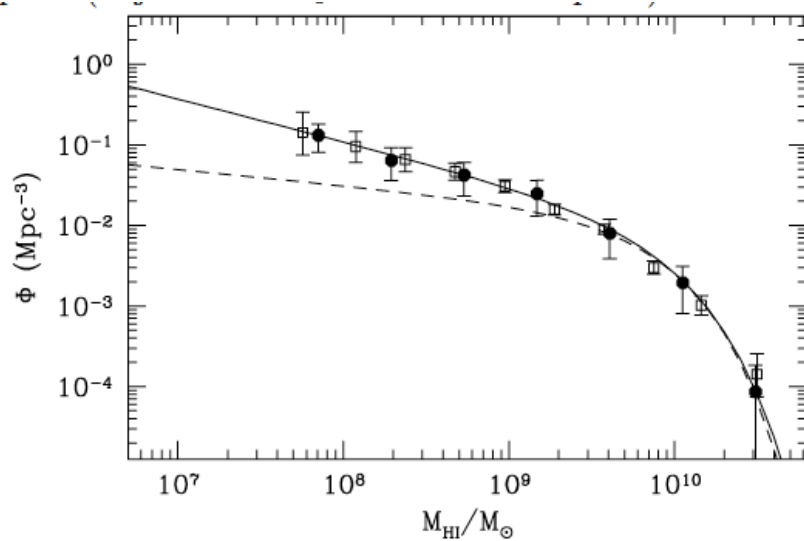
zCOSMOS (Lilly et al. 2007) with VLT. 20,000 at  $z \sim 1$ , and 10,000 galaxies at  $z \sim 2$ .



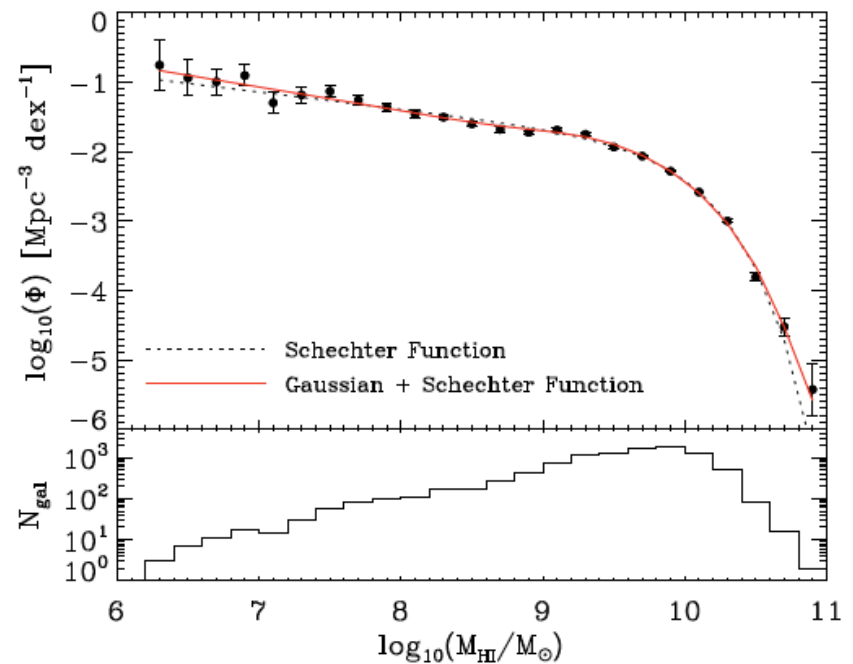
COSMOS: 2 degree field with ACS over 640 orbits. The first deep, high z, multiwavelength galaxy survey.

# Multiwavelength surveys

ALFALFA: HI 21cm survey with Arecibo (Giovanell et al. 2005), ~30,000 gals at  $z < 0.06$ .



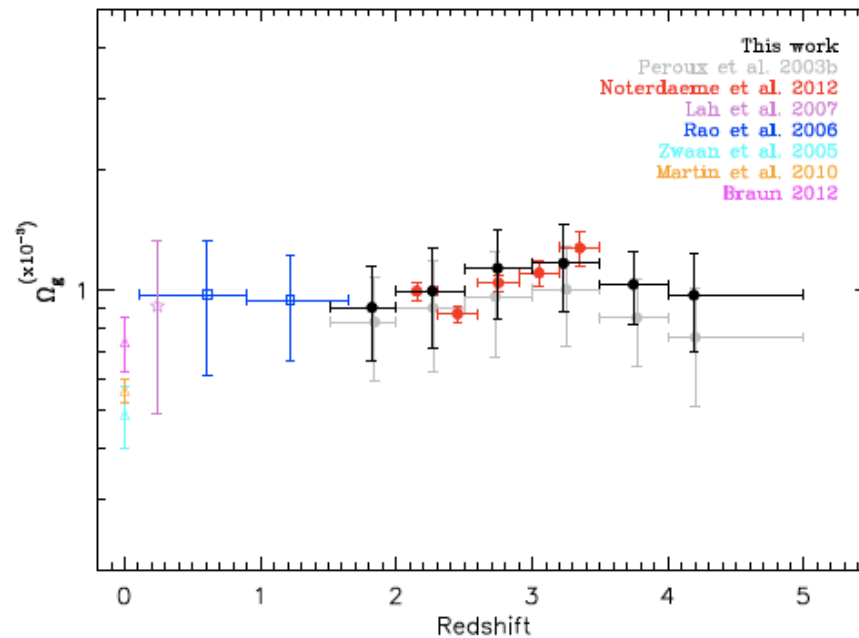
Rosenberg & Schneider (2002) with ADBS (HIPASS Zwaan et al. (1997) in dashed.  $\alpha_{\text{ADBS}} = -1.53$ ,  $\alpha_{\text{HIPASS}} = -1.2$ .



Martin et al. 2010  $\alpha = -1.33$

# Multiwavelength surveys

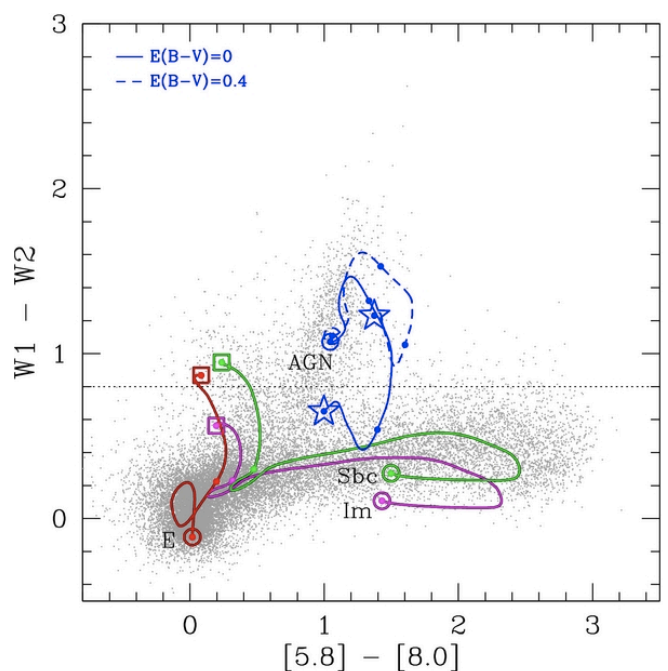
ALFALFA: HI 21cm survey with Arecibo (Giovanelli et al. 2005), ~30,000 gals at  $z < 0.06$ .



Important zero point for for cosmological measurements of  $\Omega_{\text{gas}}$

# Multiwavelength surveys

Wide-field IR Survey explorer (WISE). Mid-IR NASA small mission, all sky survey, 0.4-m mirror. Decommissioned in 2011.



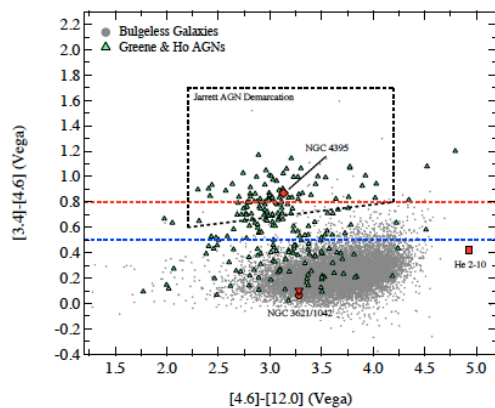
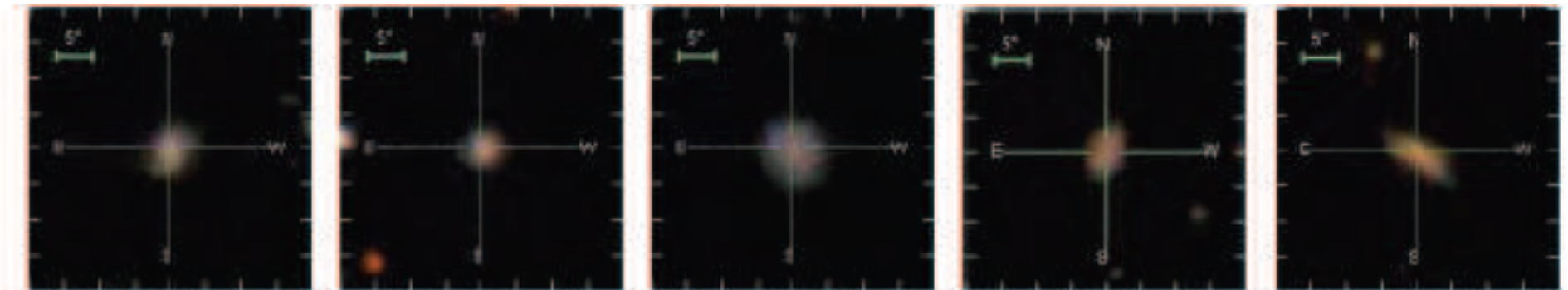
Complementary selection for AGN. Can make a simple WISE colour cut, e.g.  $W1-W2 > 0.8$ .

Assef et al. (2010, 2013).

Also studied rocky solar system objects and cool stars  
<http://wise.ssl.berkeley.edu/mission.html>

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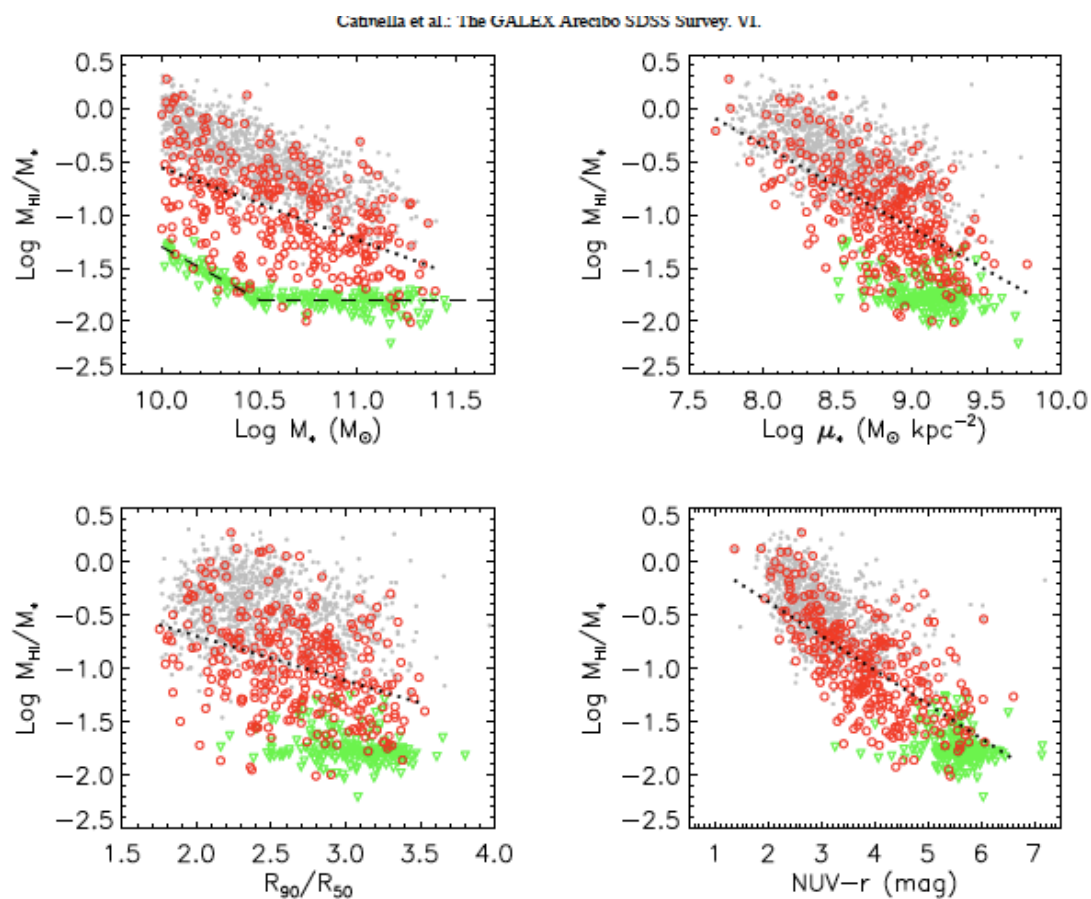


Discovery of population mid-IR selected “bulgeless” AGN.

Satyapal et al. (2014).

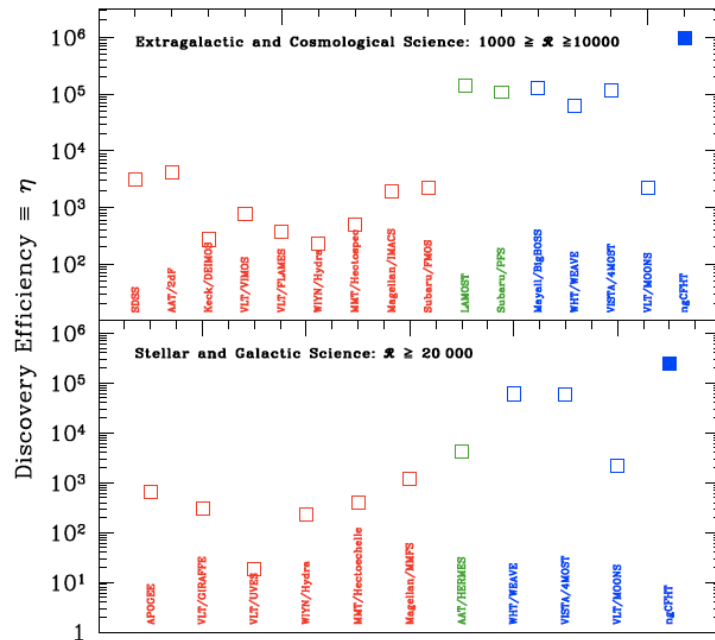
# Multiwavelength surveys

Galaxy evolution explorer (GALEX), NASA “small” explorer, all sky UV survey, 0.5-m telescope. Now decommissioned (2012). GALEX Arcicbo SDSS Survey (GASS), e.g. Catinella et al 2012.



# The future of large surveys

Mauna Kea Spectroscopic Explorer (MSE): 10-m telescope using old CFHT support building and pier. 1.5 deg<sup>2</sup> field, 3200 galaxies per shot at medium-high resolution. Project office just opened (but not fully funded yet).



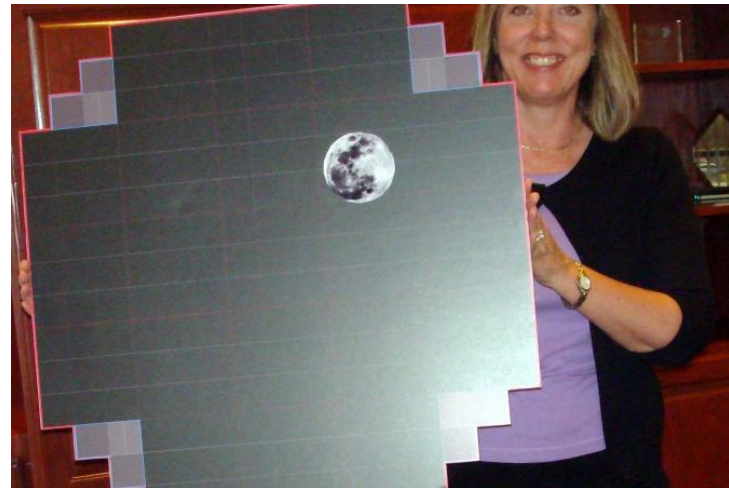
$$\eta \equiv D_{M1}^2 \Omega N_{mos} f / IQ^2.$$

Discovery efficiency  $\eta$  is function of mirror size ( $D$ ), number of objects per field ( $N_{MOS}$ ), fractional time available for survey ( $f$ ) and image quality ( $IQ$ ).



# The future of large surveys

Large Synoptic Survey Telescope (LSST): dedicated 8.4-m telescope to be built on Cerro Pachon (Chile, near Gemini). 10 deg<sup>2</sup> field of view!!  
Total survey: 30,000 deg<sup>2</sup> in 5 filters (no spectra).

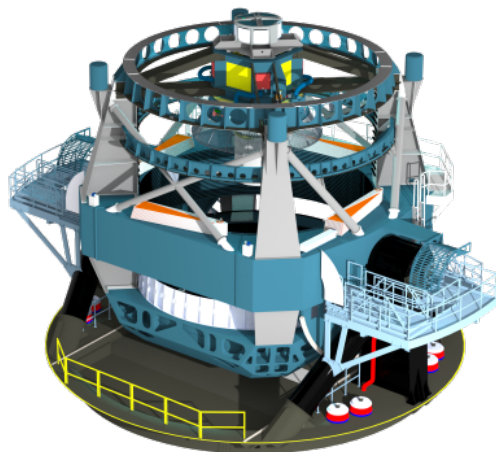


“10,000 square degrees of sky to be covered using pairs of 15-second exposures twice per night every three nights on average, with typical  $5\sigma$  depth for point sources of  $r \sim 24.5$  (AB).” Ivezić et al. (2014) LSST overview paper <http://www.lsst.org/files/docs/LSSToverview.pdf>



Main science drivers for LSST, whose strategy is deep, wide, fast:

- Probing dark energy and dark matter: weak lensing studies and SN
- An inventory of the solar system: In December 2005, the U.S. Congress directed<sup>76</sup> NASA to implement a NEO survey that would catalog 90% of NEOs with diameters larger than 140 meters by 2020.
- Exploring the transient sky: (micro-)lensing events, supernovae, exoplanets, AGN monitoring, variable stars, GRBs.
- Mapping the Milky Way: streams, stellar populations, RR Lyrae



## Our database and getting an account

Unix machine “llaima” hosts “sdss” database accessed by mysql.

Llaima access for netlink ID “student” via netlink passwd:  
ssh [student@llaima1p.mysql.uvic.ca](ssh://student@llaima1p.mysql.uvic.ca)

Accessing database with mysql passwd:  
mysql -u student -p --socket=/m1/LLAIMA1P/mysql.sock

Test commands in mysql:

```
use sdss;
```

```
show tables;
```

```
describe dr7_uberuber;
```

```
select count(*) from dr7_uberuber;
```

```
select count(*) from dr7_uberuber where z_spec >0.2;
```

```
select total_mass_med from dr7_uberuber limit 10;
```