#### Astr 511: Galactic Astronomy

Winter Quarter 2015, University of Washington, Željko Ivezić

## Lecture 3: Review of galaxy properties and galaxies in SDSS

## Outline

- A Little Bit of History
- Galaxy Types and Classification
- Galaxy Properties

#### Hubble's Classification of Galaxies



#### Galaxies

- Galaxies are (mostly) made of stars (also gas, dust, active galactic nuclei – AGN); hence have similar (but not identical!) color distributions
- They come in various shapes and forms (spiral vs. ellipticals; aka exponential vs. de Vaucouleurs profiles)
- Some host AGNs, some have high starformation rates, some are very unusual (dwarf galaxies, mergers, etc.)
- We are interested in various distribution functions (e.g. for luminosity, colors, mass, age, metallicity, size, etc.)
   – the hope is to figure out how galaxies formed and evolved
- Nearest neighbors: the Andromeda galaxy (M31), Large and Small Magellanic Clouds, the Sgr Dwarf (may be more)

5 arcmin x 5 arcmin true-color g-r-i images from SDSS comissioning data. Galaxy classification is from SIMBAD.

## Most important historical breakthroughs in galaxy research

- Around 1610: Galileo Galilei resolves the Milky Way into individual stars
- Around 1750: Immanuel Kant developes the idea of "island universes" – different galaxies just like our own
- Around 1850: William Parsons discovers spiral structure and proposes that some galaxies rotate
- 1923/24: Edwin Hubble resolves M31 and M33 into individual stars – confirms that they are galaxies just like our own
- 1929: Edwin Hubble discoveres the expansion of the Universe

- 1933: Fritz Zwicky claims the existence of "dark matter" based on observed speeds of cluster galaxies (*nobody believes him!* – for a rap song about this see astro-ph/9610003)
- 1970-1980: Vera Rubin's work on rotation curves of spiral galaxies – dark matter idea becomes widely accepted



## Hubble's Morphological Classification

- Broadly, galaxies can be divided into ellipticals, spirals, and irregulars
  - Broadly, spirals are divided into normal and barred (similar frequencies): S and SB
  - The subclassification (a, b, or c) refers both to the size of the nucleus and the tightness of the spiral arms. For example, the nucleus of an Sc galaxy is smaller than in an Sa galaxy, and the arms of the Sc are wrapped more loosely.
- The number and how tightly the spiral arms are wound are well correlated with other, large scale properties of the galaxies, such as the luminosity of the bulge relative to the disk and the amount of gas in the galaxy. This suggests that there are global physical processes involved in spiral arms.

### Overview of classification systems:

System	Principal criteria	Symbols	Examples
Hubble-Sandage	barrishness;	E, S0, S, SB, Irr	M87=E1
(Sandage	openess of arms/disk-bulge ratio;	a, b, c	M31=Sb
(1961-1995))	degree of resolution of arms into stars		M101=Sc
			LMC=Irr I
De Vaucouleurs	barrishness;	E, S0, S, SA, SB, I	M87=E1P
(de Vaucouleurs	openess of arms/disk-bulge ratio;	a, b, c, d, m	M31=SA(s)b
(1959))	rings or s shapes	(r), (s)	M101=SAB(rs)cd
			LMC=SB(s)c
Yerkes	central concentration of light;	k, g, f, a	M87=kE1
(Morgan	barishness/smoothness	E, R, D, S, B, I	M31=kS5
(1958-1970))			M101=fS1
			LMC= afl2
DDO	richness of disk in young stars;	E, S0, A, S, Ir	M87=E1
(van den Bergh	barrishness;	В	M31=Sb I-II
(1960-1976))	central concentration of light;	a, b, c	M101=Sc I
	quality and length of arms	I, II,, V	LMC=Ir III-IV

#### Spiral (Sa) Galaxies:



NGC 3223: Sa-galaxy



M 104 (Sombrero), Sa-galaxy (P.Barthel, VLT)

### Barred-Spiral (SBb) Galaxies:



M 95: SBb-galaxy



NGC 2523: SBb-galaxy

#### Irregular (Irr) Galaxies:



#### LMC: Irr-galaxy



SMC: Irr-galaxy

- Primary classification criteria of commonly used Hubble-Sandage system:
  - Bulge-to-disk ratio (S0/Sa: 5 to 0.3, Sb: 1 to 0.1, Sc/Irr: 0.2 to 0)
  - Opening angle of spiral arms (Sa: 0 to 10, Sb: 5 to 20, Sc: 10 to 30 degrees)
  - Bars
- Physical parameters varying along the Hubble-Sandage system:
  - $\sim$  Stellar mass M increases from irregulars ( $10^8 M_{\odot}$ ) to ellipticals ( $10^{12} M_{\odot}$ )
  - $\bullet$  Specific Angular Momentum J/M of baryons increases from ellipticals to spirals
  - Mean age increases from irregulars through spirals to ellipticals (B-V increases from 0.3 to 1.0, mass-to-light  $M/L_B$  ratio increases from about 2 to 10)
  - Mean stellar density of spheroids increases with decreasing spheroid luminosity
  - Mean surface brightness of disks increases with luminosity
  - cold gas content increases along Hubble sequence (fraction of baryonic mass: 0 in E/S0, 0.1 to 0.3 in Sa to Sc, up to 0.9 in Irr)
  - hot gas content only significant in massive E (few percent of baryonic mass)

## Galaxy types that didn't make it into the Hubble-Sandage system

dwarf galaxies:

dE: dwarf ellipticals or dwarf spheroidals, similar to E but of low luminosity and low surface brightness

BCD: Blue Compact Dwarfs, concentrated starburst, faint old stellar components

cD-galaxies:

Yerkes classification for "extra (c) large and diffuse (D)" galaxies, found in the centers of clusters and groups

- low surface brightness (LSB) galaxies: mostly luminous but very low surface brightness disk galaxies
- active galaxies: radio galaxies; galaxies with unusual nuclear emission lines and/or extreme nuclear luminosity (QuasiStellarObjects-QSOs, Seyfert galaxies) and/or with powerful non-thermal radio emission (radio galaxies, quasars)
- interacting, merging and starbursting galaxies (IRAS mergers, ULIRGs, i.e. Ultra-Luminous Infra-Red Galaxies)



#### Colors are correlated with morphology

- Galaxies have bi-modal color distribution (e.g. SDSS u - r color: the ratio of the UV and red fluxes): see histograms from Strateva et al. (2001, AJ, 122, 1861)
- Colors correlated with shapes and profiles: blue galaxies tend to be spiral and red galaxies tend to be elliptical (there are deviants such as e.g. "anemic spirals")
- A good parametrization for shapes (i.e. intensity vs. radius R) is **the Sersic index** n:  $I(R) \propto \exp(-(R/R_e)^{1/n})$
- n = 1: exponential profile
- n = 4: de Vaucouleurs profile

#### Note the bulge contribution!



FIG. 6.—Elliptically averaged profiles for the 26 spiral galaxies. For NGC 4594 the north half of the minor axis is shown. Where an iterative decomposition was possible, disk, bulge, and total profiles are shown. In all other cases, only the bulge fit is shown.

## The light intensity distribution as a function of (elliptical) radius

Astronomers usually express brightness on a logarithmic (magnitude) scale (well, at least optical astronomers do):

$$\log I(R) = a - b R^{1/n} \tag{1}$$

Given an image of a galaxy (i.e. I as a function of R), one can determine a, b and n. Sometimes, n is fixed as a function of galaxy's morphology, and only a and b are fit to the data.

Sometimes, de Vaucouleurs profile is expressed as

$$I(R) = I_0 \, 10^{-3.33 \left[ \left( \frac{R}{R_{1/2}} \right)^{1/4} - 1 \right]} \tag{2}$$

or for surface brightness (e.g.  $mag/arcsec^2$ )

$$\mu = -2.5 \log \left[ I(R) \right] = \mu_o + 8.33 \left[ \left( \frac{R}{R_{1/2}} \right)^{1/4} - 1 \right]$$
(3)

## The light intensity distribution as a function of (elliptical) radius

Integral of I(R) over the entire galaxy gives flux

$$F = 2\pi \int_0^\infty I(R) \, R dR \tag{4}$$

This assumes that the profile was averaged in elliptical annuli. In general,

$$F = \int_0^\infty \int_0^{2\pi} I(R,\phi) \, R dR d\phi \tag{5}$$

Here, I(R), and this F is measured at some wavelength (and in some band). Integration over all wavelengths gives *bolometric* flux.

If flux F is multiplied by  $4\pi D^2$ , where D is distance, one gets *luminosity*. Beware of units!

## The light intensity distribution as a function of (elliptical) radius

**Freeman's law:** when  $\mu(R)$  is extrapolated to the center of the galaxy (R=0, and excluding the bulge contribution), one gets a similar answer (to within 40-50%) for all spiral galaxies!

This all (i.e. exp. profile and Freeman's law) applies to disks of spiral galaxies. What about (luminous) halo?

The answer depends on tracer; for the Milky Way

- globular clusters:  $I(R) \propto R^{-3.5}$
- RR Lyrae:  $I(R) \propto R^{-3.0}$



- Spectra are correlated with morphology
- Galaxies with weak blue flux tend to be ellipticals (consistent with conclusions based on colors, of course)
- Galaxies with emission lines tend to be spiral galaxies (though not all)
- Both AGNs and star-forming galaxies show emission lines: How do we separate AGNs from star-forming galaxies? Using the emission line ratios (which are also correlated with colors and shapes) (next time...)

## Rotation of Stars in the Disks of Spiral Galaxies

- Most stars in spiral galaxies are concentrated in fairly thin disks
- Stars move around the galaxy center described by the rotation (circular velocity) curve  $v_c(R)$
- The shape of rotation curve depends on the distribution of enclosed mass e.g. for a point mass  $v_c(R) \propto 1/\sqrt{R}$
- In general,  $v_c^2(R) = R(d\Phi(R)/dR)$ , where  $\Phi$  is the gravitational potential ( $\Phi$  follows from the mass density profile via Poisson equation)
- We know the disk light intensity profile; we can assume that mass is following light and predict  $v_c(R)$  for an exponential disk; but...



Figure 2-17. The circular-speed curves of: an exponential disk (full curve); a point with the same total mass (dotted curve); the spherical body for which M(r) is given by equation (2-170) (dashed curve).

### Rotation of Stars in the Disks of Spiral Galaxies

The prediction for rotation curve in an infinitely thin exponential disk (the previous slide) involves (somewhat) complicated Bessel functions. A much simpler, but still decent approximation is

$$v_c(R) = 0.876 \sqrt{\frac{GM}{R_e}} \sqrt{\frac{r^{1.3}}{1+r^{2.3}}}$$
 (6)

where  $R_e$  is the scale length  $(I(R) \propto \exp(-R/R_e))$ , and  $r = 0.533R/R_e$ .

Note that for  $R >> R_e$ ,  $v_c(R) \propto 1/\sqrt{R}$ 

FYI: if M is measured in solar masses  $(M_{\odot})$ , R in pc,  $v_c$  in km/s, then the gravitational constant is G = 233

What do we get from observations?

## Measurements of the Rotation Curve

The circular speed can be determined as a function of radius by measuring the redshift of emission lines of the gas contained in the disk:

Hot stars ionize gas: hydrogen emission lines (e.g.  $H_{\alpha}$ ) in the optical

Neutral atomic hydrogen gas: hyperfine structure transition (due to flip in electron spin) leads to 21 cm radio line

## $H_{\alpha}$ measurements



Figure 10-1. Photographs, spectra, and rotation curves for five Sc galaxies, arranged in order of increasing luminosity from top to bottom. The top three images are television pictures, in which the spectrograph slit appears as a dark line crossing the center of the galaxy. The vertical line in each spectrum is continuum emission from the nucleus. The distance scales are based on a Hubble constant h = 0.5. Reproduced from Rubin (1983), by permission of *Science*.



FIGURE 1. Rotation curves of 25 galaxies of various Hubble types.

From A. Bosma's PhD Thesis (1978).

## "Flat" rotation curves

- The measurements show that rotation curves are "flat" they are not approching the  $v_c(R) \propto 1/\sqrt{R}$  behavior expected in the outer parts of disks
- Therefore, there must be an invisible galaxy component that is capable of producing gravitational force
- Earlier (1930's) suggested by Fritz Zwicky, became an accepted view after Rubin's work
- While, in principle, this discrepancy could also be due to a different gravitational law (i.e. force that is not  $\propto 1/R^2$ ), the modern data, including cosmic microwave background measurements, suggest that indeed that is a "dark matter" component contributing ~5 more gravitational force than stars and gas combined!

#### A simple analytical model for dark matter halos

$$\rho = \rho_0 \frac{a^2}{r^2 + a^2} \qquad (r \gg a \to \rho \sim r^{-2})$$
$$M(r) = \int_0^r 4\pi \rho r^2 dr \qquad (\text{Bronstein No. 68})$$
$$= 4\pi \rho_0 a^3 \left(\frac{r}{a} - \arctan\frac{r}{a}\right)$$

circular velocity :  $v_c(r) = \sqrt{\frac{GM(r)}{r}}$ 

$$v_c(r) = \left[4\pi G\rho_0 a^2 \left(1 - \frac{a}{r} \arctan \frac{r}{a}\right)\right]$$
$$r \gg a : \quad v_c \to \sqrt{4\pi G\rho_0 a^2} \simeq \text{const}$$
$$r \ll a : \quad v_c \to \sqrt{\frac{4\pi G\rho_0 a^2}{3}} \cdot \frac{r}{a}$$

**65**)





**DISTRIBUTION OF DARK MATTER IN NGC 3198** 

### The Tully-Fisher Relation

The (maximum, the flat part value) rotation velocity is related to galaxy's luminosity:

$$M_B = A \log v_c + B \tag{7}$$

where  $A \sim -10$  and  $B \sim 3$  depend slightly on galaxy's morphological type.

Another way of expressing the same correlation

$$L \propto v_c^{-0.4A} \propto v_c^4 \tag{8}$$

Why? From the virial theorem,  $v^2 \propto M/R$ . Also,  $L \propto IR^2$ , and hence

$$L \propto \left(\frac{M}{L}\right)^{-2} I^{-1} v^4 \tag{9}$$

Since  $I \sim \text{const.}$  (Freeman's law), the Tully-Fisher relation implies that  $(\frac{M}{L}) \sim \text{const.}$  for spiral galaxies (~30 in the B band, and in solar units)



Lord Rosse in 1845 "discovered" spiral structure in M51 (this is an HST image of M51)



Not all spirals are alike!









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A flocculent spiral with ragged spiral arms.

In addition to Hubble's classification, there are different types of spiral structure: grand design spirals, with clearly outlined and well organised globally correlated spiral structure, and flocculent (fluffy) spirals with many small short globally uncorrelated spiral arms



## Theories of Spiral Structure

Despite 50 years of work, spirals are not very well understood. It seems clear now that the spiral structure of galaxies is a complex problem without any unique and tidy answer.

Differential rotation clearly plays a central role, as well as global instabilities, stochastic spirals, and the shocks patterns that can arise in shearing gas disks when forced by bars.

There are (at least) two popular theories, one of which is more commonly used to explain grand design spirals, the other for flocculent spirals.

But before proceeding: winding problem (Lindblad)

## Winding problem



*Differential rotation*: stars near the center take less time to orbit the center than those farther from the center. Differential rotation can create a spiral pattern in the disk in a short time.

## Winding problem



Prediction: 500 million years



Observation: 15,000 million years

The problem: most spiral galaxies would be tightly wound by now, which is inconsistent with observations.

Spiral arms cannot be a static structure (i.e. at different times, arms must be made of different stars)



Spiral density waves are like traffic jams. Clouds and stars speed up to the density wave (are accelerated toward it) and are tugged backward as they leave, so they accumulate in the density wave (like cars bunching up behind a slower-moving vehicle). Clouds compress and form stars in the density wave, but only the fainter stars live long enough to make it out of the wave.

## Density Wave theory C.C. Lin & F. Shu (1964-66)

- This is the preferred model for grand design spirals.
- The spiral arms are overdense regions which move around at a different speed than star: stars thus move in and out of the spiral arm How these density waves are set up is unclear, but it may have to do with interactions. Once they are set up, they must last long enough time for а to be consistent with the observed number of spiral galaxies

## Stochastic Self-Propagative Star Formation

- This model probably cannot explain grand design sprials, but it may account for flocculent spiral structure.
- Ongoing star formation triggers star formation in areas adjacent to it. As the galaxy rotates, differential rotation leads to the appearance of a spiral pattern.

Spiral arms are made of short-lived massive blue stars!



Note that the smaller galaxy (NGC 5195) is not visible in GALEX image (left).

The spiral structure is associated with (short-lived) hot stars.



Numerical simulations of stochastic self-propagating star formation in spirals (Gerola & Seiden 1978, ApJ 223, 129). Originally roundish star formation regions get stretched out in differential rotation. Numbers give the time in units of 15 Mio. years, the upper panel is for the rotation curve of M101, the lower for M81.



**Disks contain a lot of dust!** Spiral arms are almost exclusively seen in disks with a lot of gas and dust, unlike bars which are often seen in galaxies without ISM. Bars are not a wave of star formation – they are orbital features.

To remember:

- Spiral arms are not static structure (winding problem)
- Not all spirals are alike: more than one pattern
- Not clear if transient or quasy-steady phenomenon; the extent controlled by Lindblad resonances
- The appearance dominated by young luminous blue stars, but the overall density of *all* stars is elevated by 10-20% in spiral arms

Types of Elliptical Galaxies

You've seen one, you've seen them all! Not true.

- Giant luminous ellipticals, cD: the largest (1 Mpc!) and most luminous galaxies, very large mass-to-light ratios (lots of dark matter), masses  $10^{13} 10^{14}$  M<sub> $\odot$ </sub>
- Normal ellipticals: most numerous, masses  $10^8 10^{13} M_{\odot}$
- Dwarf ellipticals: masses  $10^7 10^9 M_{\odot}$  fundamentally different from all other ellipticals by having low surface brightness and lower metallicity
- Dwarf spheroidals: masses  $10^7 10^8 M_{\odot}$ , the low-mass end of normal ellipticals

• Blue compact dwarf galaxies: masses  $\sim 10^9~M_{\odot}$ , similar to dwarf ellipticals but unusually blue colors – indicates ongoung star formation (yes, they do have lots of gas); very low mass-to-light ratios

### The Faber-Jackson Relation

Remember the Tully-Fisher Relation for spiral galaxies?

 $L \propto v_c^4 \tag{10}$ 

Here  $v_c$  is the rotational velocity.

Do we have an analogous relation for elliptical galaxies?

Unlike spiral galaxies, elliptical galaxies don't rotate – use the velocity dispersion,  $\sigma$ , instead.

The Faber-Jackson Relation:

## $L \propto \sigma^4$

(11)

Actually, the exponent varies from 3 to 5, depending on sample and band.

The scatter in the FJ relation is decreased by adding another physical parameter – the fundamental plane:

$$L \propto \sigma^{2.65} r_e^{0.65} \tag{12}$$



The velocity dispersion is the width of the velocity distribution.

Until the late 1970s, it was believed that elliptical galaxies are simple systems: gas-free, disk-free, rotationally flattened ellipsoids of very old stars. In the last 20 years, most of these assumptions turned out to be wrong or only crude approximations:

- Massive ellipticals are not flattened by rotation, but are anisotropic.
- Ellipticals do have an interstellar medium, but it is hot  $T > 10^6$ K.
- A significant fraction of ellipticals exhibits kinematic peculiarities (like conter-rotating cores) which point to a 'violent' formation process.
- Ellipticals frequently contain faint stellar disks.
- Low mass ellipticals seem to contain intermediate age stars.
- All ellipticals and bulges seem to contain supermassive black holes amounting to about 0.2% of their mass.

Until today, ellipticals are characterized by their apparent flattening (despite it is dependent on projection):

**E0** ... **E7**, where the number corresponds to  $10 \cdot (1 - b/a)$ 

with b being the projected short axis and a the projected long axis.

#### The Light Profiles of Elliptical Galaxies

Remember the Sersic profile:  $I(R) \propto \exp(-(R/R_e)^{1/n})$ ? For elliptical galaxies n = 4 – de Vaucouleurs profile:

$$I(R) = I_0 \, 10^{-3.33 \left[ \left( \frac{R}{R_{1/2}} \right)^{1/4} - 1 \right]} \tag{13}$$

Another commonly used profiles are King models (isothermal sphere) and Jaffe's spheres. The latter has almost identical light profile as de Vaucouleurs profile, but the density law and gravitational potential are analytic:

$$\rho_L(r) = \frac{L}{4\pi r_o^3} \left(\frac{r_o}{r}\right)^2 \frac{1}{(1+r_o/r)^2}$$
(14)

$$\Phi(r) = \frac{GL}{r_o} \left(\frac{M}{L}\right) \ln\left(\frac{1}{1 + r_o/r}\right)$$
(15)



**Left:** Jaffe-fit to the prototypical elliptical NGC 3379 from Surma, Seifert, Bender (1992) *A&A*. **Right:** Comparison of different SB-profiles of galaxies. Red squares: Jaffe model, blue circles:  $r^{1/4}$ -model, cyan crosses: exponential, lines are King models of different binding energy.



## True shapes of elliptical galaxies

- The classification of elliptical galaxies (E0–E7) is based on **apparent** flattening: are the true shapes bi-axial (as expected for rotation), or triaxial (as expected for randomly distributed orbits)?
- Elliptical galaxies are modestly triaxial a:b:c ~ 1:0.95:0.7 (nearly oblate, a=b>c, like an UFO, as opposed to prolate, a>b=c, like a football)

We know that because of the effect called "isophote twist", which doesn't happen for bi-axial shapes, only for triaxial

- Therefore, (most) elliptical galaxies are NOT supported by rotation
- Isophotes are not exactly elliptical: boxy
  vs. disky. The latter can be explained as a superposition of an elliptical bulge on a faint edge-on disk.

FIGURE 3. — Distribution of the ellipticity classes for all observed elliptical galaxies.



FIGURE 5. — Schematic drawing illustrating isophotes with a(4)/a = +0.1 and a(4)/a = -0.1.



FIGURE 6. — R-image of NGC 4660, an elliptical galaxy with a disk-component in the isophotes  $(a(4)/a \sim +0.03)$ .



FIGURE 7. -- R-image of NGC 5322, an elliptical galaxy with box-shaped isophotes  $\langle a(4)/a \sim -0.01 \rangle$ .

Examples for boxy and disky isophotes from Bender et al. 1988

The central regions of elliptical galaxies include two types of profiles: cuspy cores and power-law cores





## Dark Matter in Elliptical Galaxies

In the central part of elliptical galaxies there is no evidence for dark matter (mass-to-light ratio  $\sim$ 5–10 in solar units – typical for old stellar populations). In the outer parts it is harder to find such evidence because there is no gas on circular orbit as is the case for spiral galaxies.

Nevertheless, there are several methods that indicate the presence of dark matter in elliptical galaxies:

- 1. Analysis of stellar kinematics (detailed models of motion in gravitational potential)
- 2. Gravitational lensing

3. X-ray halos (application of virial theorem)

- Imaging Survey
  - $-10,000 \text{ deg}^2$  (1/4 of the full sky)
  - 5 bands (ugriz: UV-IR), 0.02 mag photometric accuracy
  - < 0.1 arcsec astrometric accuracy
  - 100,000,000 stars and 100,000,000 galaxies
- Spectroscopic Survey
  - 1,000,000 galaxies
  - 100,000 quasars
  - 100,000 stars



Strateva et al. (2001, AJ 122, 1861): bimodal u - r color distribution (u - r) is similar to U - V



The broad band SEDs of galaxies are nearly one-dimensional family.

"Everything is correlated with everything" (Blanton et al. 2003)





## SDSS Spectroscopic Galaxy Survey

- Two samples:
  - 1. the "main" galaxy sample ( $r_{Pet} < 17.77$ ):  $\sim$ 1 million spectra
  - 2. luminous red galaxy sample (LRG, cut in color-magnitude space):  $\sim$ 100,000 spectra
- Distance estimate allows the determination of luminosity function (Blanton et al. 2001)
- Spectra are correlated with morphology (and colors)



- Spectra are correlated with morphology
- Principal component analysis: spectra form a low-dimensional family: it is possible to describe most of variance using only 2 parameters (Yip et al. 2004)



• Spectra are correlated with morphology Principal component analysis: eigenspectra can be non-negative, which is not physical; there are other mathematical methods, such as non-negative matrix factorization (also, non-linear methods known as manifold learning, e.g. locally linear embedding and isometric mapping), see astroML for code.



- Spectra are correlated with morphology
- Principal component analysis: spectra form a low-dimensional family: it is possible to describe most of variance using only 2 parameters (Yip et al. 2004)
- What physical quantities can we extract from SDSS spectra of galaxies?



## Spectral analysis

- Kauffmann et al. (2003, 2004): model-dependent estimates of stellar mass and dust content using  $H_{\delta}$ ,  $D_{4000}$ and broad-band colors
- From the position in the  $H_{\delta} D_{4000}$ diagram, get a model-dependent estimate of stellar mass-to-light ratio, and using measured luminosity get stellar mass. The measured luminosity is corrected for the dust extinction estimated from the discrepancy between the model-predicted and measured broad-band colors.



## Narrow-band rest-frame colors of galaxies in SDSS

- Strömgren colors: designed for estimating effective temperature, metallicity and gravity for stars; narrow band (200 Å)
- SDSS spectra can be used to synthesize narrow-band rest-frame colors for galaxies
- Can we determine age and metallicity of galaxies?





## Narrow-band rest-frame colors of galaxies in SDSS

- Galaxies form a narrow locus in restframe colors: SEDs are nearly a onedimensional family, with the Hubble type controlling the position along the locus (Smolčić et al. 2006, MNRAS 371, 121)
- The locus width is only 0.03 mag; the offset in the "narrow" direction is correlated with the dust content
- In order to demonstrate that this width is only 0.03 mag, an accurate survey such as SDSS was needed!







# Narrow-band rest-frame colors of galaxies in SDSS

- Left: color-coded by P1 from the previous page
- Many observables are correlated!
- E.g. the rest-frame colors with the position in the  $H_{\delta}$   $D_{4000}$  diagram
- This implies: galaxy mass and colors are well correlated the bimodal distribution in colors reflects a characteristic galaxy mass (stars only):  $\sim 3 \times 10^{10}$  M<sub> $\odot$ </sub>.
- This characteristic galaxy mass probably marks the transition between different physical processes that control galaxy formation and evolution



### Galaxy Evolution

- SDSS observations are essentially a snapshot at z = 0 (now!).
  - Bell et al. (2012, ApJ 753, 167): "We use HST/WFC3 imaging from the CANDELS Multicycle Treasury Survey, in conjunction with the Sloan Digital Sky Survey, to explore the evolution of galactic structure for galaxies with stellar masses  $> 3e_{10} M_{sun}$  from z = 2.2 to the present epoch, a time span of 10 Gyr. We explore the relationship between rest-frame optical color, stellar mass, star formation activity and galaxy structure."
- Left: (fig. 4): The evolution of U Vrest-frame color as a function of stellar mass, in redshift bins (the symbol size scales with observed galaxy size, and are color-coded by star-formation: quiescent galaxies are red). <sup>67</sup>

- Morphology-density relation: red elliptical galaxies are found in regions more populated by galaxies than blue spiral galaxies (Dressler 1980, ApJ 236, 351; Postman & Geller 1984, ApJ 281, 95)
- SDSS-based visualization (Cowan & Ivezić 2008, ApJ 674, L13):



FIG. 5.—Color-magnitude diagram for SDSS and MS galaxies in the left and right panels, respectively. The labeled white lines show which regions on the plot are most populated (these are complete volume-limited samples), and the color-coded background shows the median local environment around galaxies with a given color and magnitude (dark corresponds to low densities; bright corresponds to high densities).