

# **Galaxy Structural Analysis clues from their formation and evolution**

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# Purpose

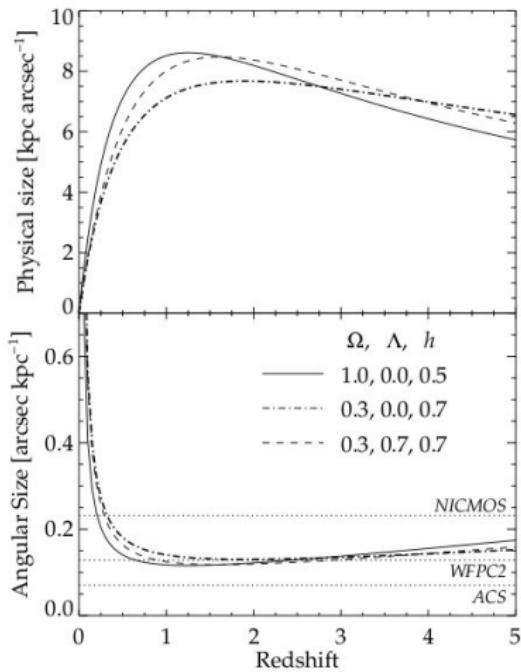
To give a general and simple overview of galaxy formation and evolution, how it affects galaxy structural parameters and how can we measure them, particularly in data from upcoming large photometric surveys

- ① Galaxy Formation and Evolution
- ② Structural Parameters
- ③ Measuring Photometric Techniques
- ④ (very) early results

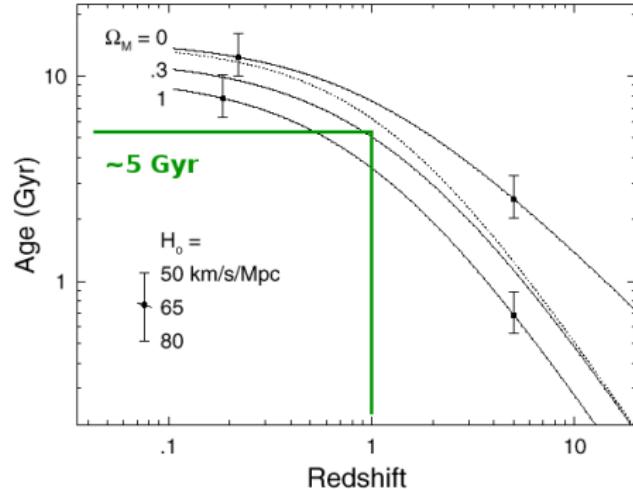
# What we'd like to know

- Galaxy formation mechanisms, triggers,
- Galaxy evolutionary paths
- Galaxy morphology at different environments
- Galaxies dynamics       $f(\mathbf{r}, \mathbf{v}, t)$
- Galaxy and Universe evolution
- spheroid × disc dispute over  $z$
- Elliptical galaxies

# What we can



Papovich et al. 2003 ApJ 598 827P



Fred Hamann ASP Conf. Series, La Serena, Chile, May 18-22, 1998

JPAS  $m_{AB} < 25$

SDSS  $r < 22$        $\overline{PSF} \sim 1.2''$

$z \sim 1$  just overall properties

# Galaxy Formation Mechanisms I

## Monolithic Collapse      Eggen, Lynden-Bell, Sandage 1962

- observed stellar orbits with high eccentricity and high angular momentum
- forms central dense region
- deep fields revealed the opposite

## Hierarchical Merging      White & Rees 1978, Fall & Efstathiou 1980

- first, stable dark matter halo (80% total mass)
- luminous matter condensates in the dark halo potential well

## Gas Infall      Blumenthal et al. 1986

- dark matter squeeze during formation
- smaller core radius and greater central density
- halos are not isothermal spheres today
- halos are not rigid

# Galaxy Formation Mechanisms II

## Secular Evolution      Kormendy & Kennicutt 2004 (review)

- **far past:** hierarchical clustering, merging
- **far future:** secular evolution  
slow rearrangements of energy and mass by collective phenomena
- **now:** both are important
- bulges:
  - classic: build from mergers
  - pseudo: slowly built out of disk gas

# Galaxy Formation Timescales and Constraints

- Hubble time
- Dynamical time
- Cooling time
- Star formation time (rate)
- Merging time
- Dynamical friction time

cf. Mo, van den Bosch & White, Galaxy Formation and Evolution, 2009.

# Some Important Facts

# Morphological Evolution with $z$

**Table 1:** Summary of key ages in galaxy morphology to  $z=1$

Redshift	Look-back Time	Key Developments in Galaxy Morphology
$z < 0.3$	$<\sim 3.5$ Gyr	Grand-design spirals exist. Hubble scheme applies in full detail.
$z \sim 0.5$	$\sim 5$ Gyr	Barred spirals become rare. Spiral arms are underdeveloped. The bifurcated “tines” of the Hubble tuning fork begin to evaporate.
$z > 0.6$	$> 6$ Gyr	Fraction of mergers and peculiar galaxies increases rapidly. By $z=1$ around 30% of luminous galaxies are off the Hubble sequence.

Abraham & van den Bergh 2001

# Size Evolution

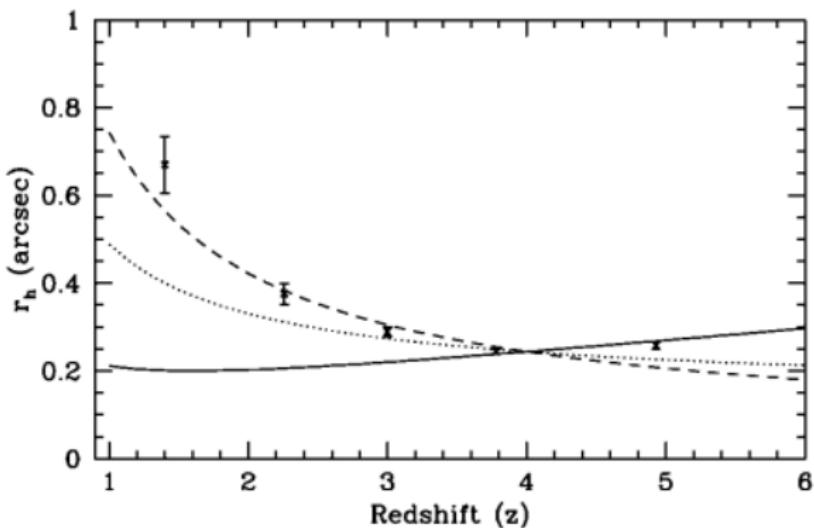
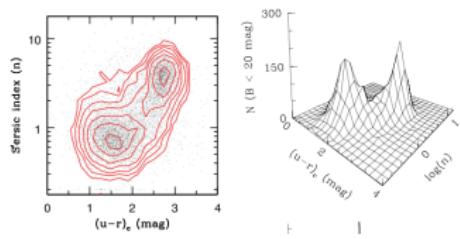


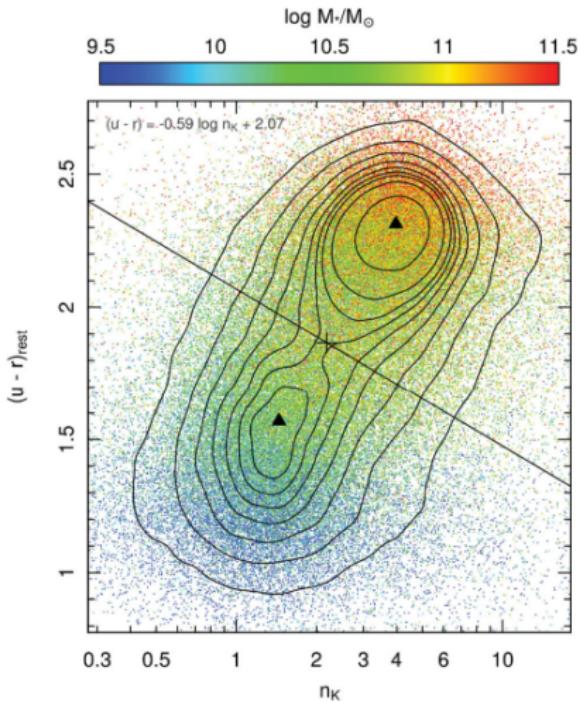
FIG. 1.—Size vs. redshift relation. Mean SExtractor half-light radii are plotted with error bars indicating the standard error of the mean (i.e., the sample standard deviation divided by the square root of the sample size). The solid blue curve shows the expected trend in the WMAP cosmology if physical (proper) sizes do not evolve. The dashed red curve shows the trend if sizes evolve as  $H^{-1}(z)$ , and the dotted green curve shows  $H^{-2/3}(z)$ . The curves are all normalized to the mean size at  $z \approx 4$  (approximately  $r_h = 1.7$  kpc). [See the electronic edition of the Journal for a color version of this figure.]

# color-concentration bimodality

**Mass more important than environment**



Driver et al. 2006

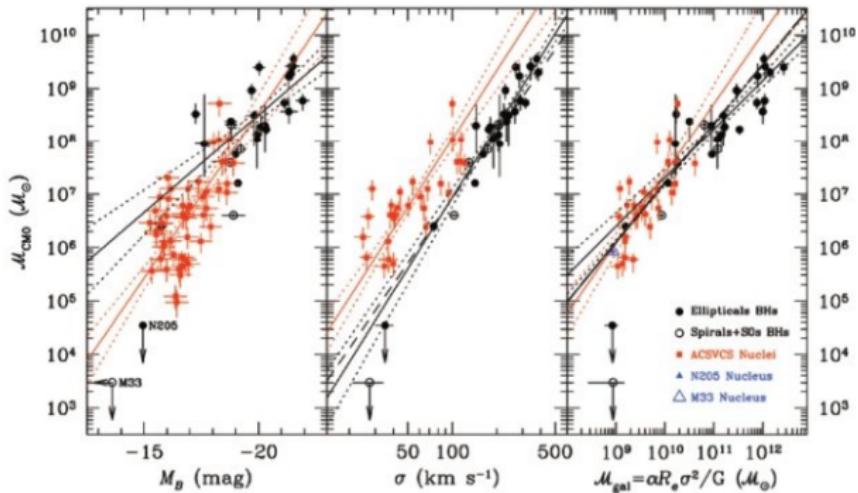


Kelvin, Driver et al. 2012

# Relationships between nucleus and host galaxy

## Central Massive Object

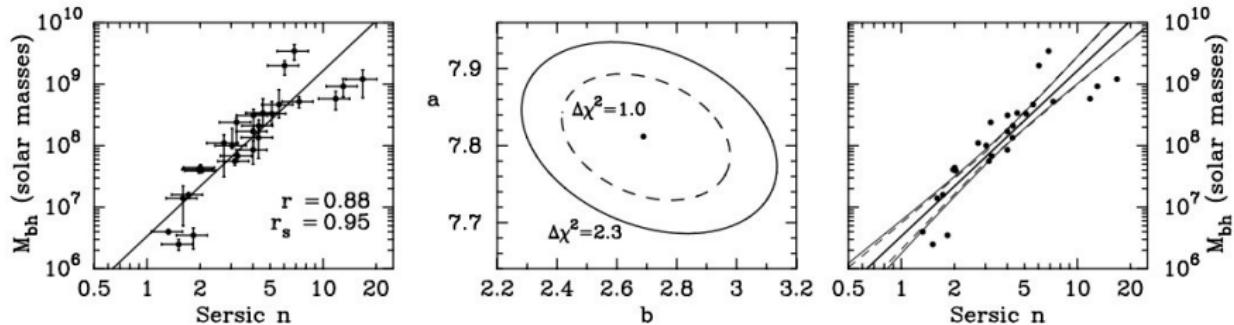
Ferrarese et al. 2006 ApJ **644**, L21



- Most galaxies contain a central massive object (CMO)
- byproduct of galaxy formation
- CMO: either *supermassive black hole* or *compact stellar nucleus*
- if  $M_{gal} \gtrsim 10^{10} M_\odot$       CMO  $\rightarrow$  SBH

# Relationships between nucleus and host galaxy

BH Mass and Sérsic index



Graham & Driver 2007 ApJ 655, 77

# Classification and Understanding

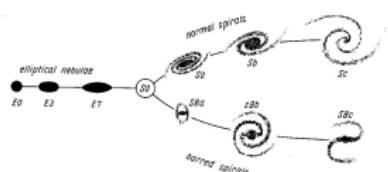
## **Classification is related to understanding**

How classify galaxies? i.e. Which types are there?

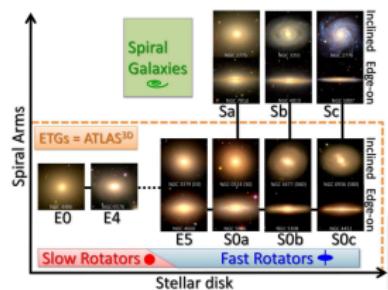
How classes vary with wavelength, mass, SFR, redshift, ...

Which are the physical fundamental parameter's?

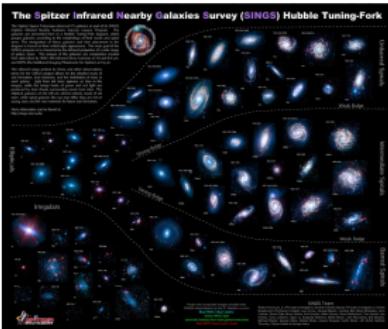
# Hubble fork I



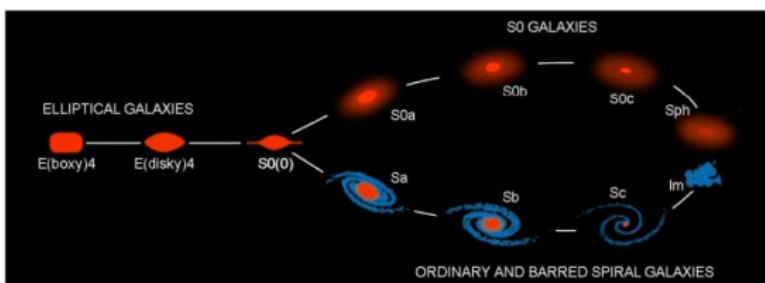
Hubble 1936



Cappellari et al 2011, ATLAS<sup>3D</sup>



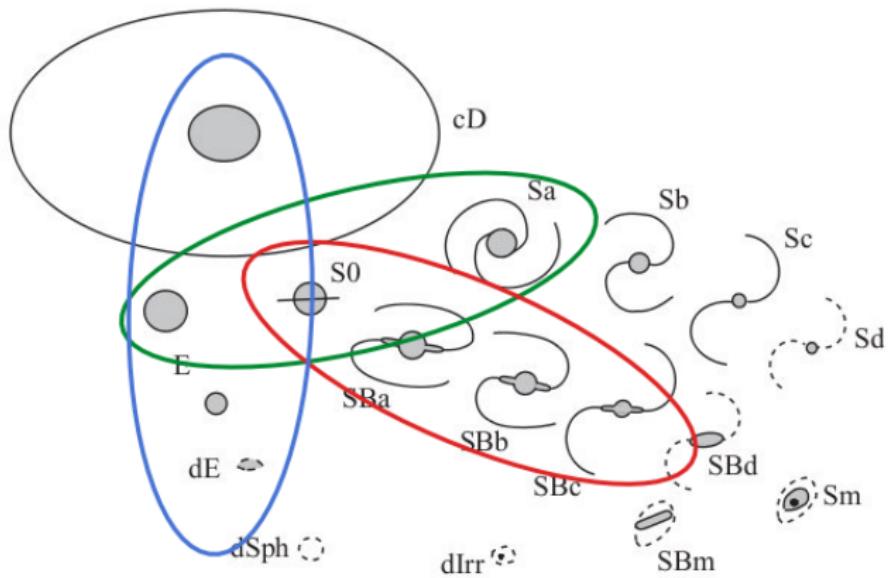
Spitzer Science Center



Kormendy & Bender 2012

"Most elliptical galaxies are like spirals" ?

# Hubble fork II



adapted from Sparke & Gallagher 2007

# Hubble fork III

## Hubble and modified Hubble schemes

- only apply to local universe.
- no evolution implied by the fork
- strong wavelength based
- there is **no eye classification** for ETG

## How they look like

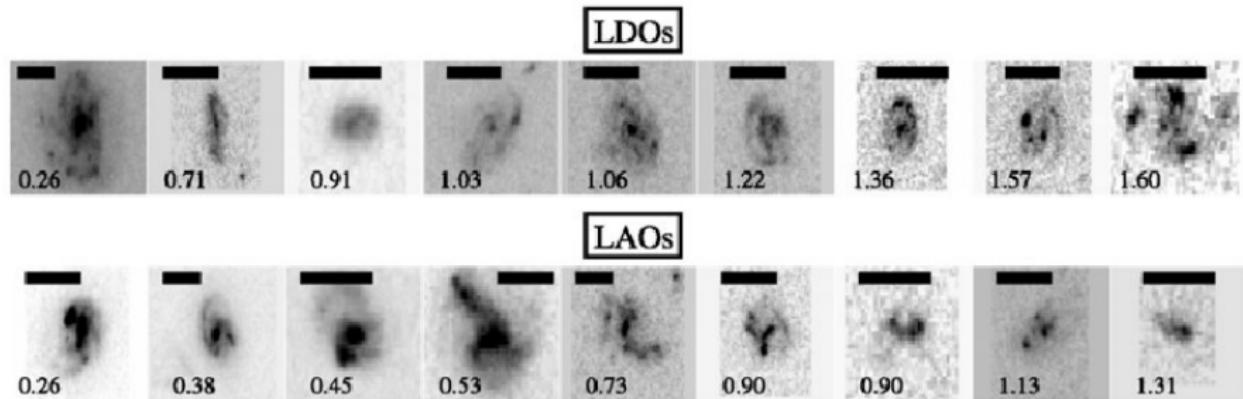


FIGURE 7: Various images of LDOs (luminous and diffuse) and LAOs (luminous and asymmetric) galaxies. Bar shows approximately  $0''.5$ . Redshifts, mainly photo-zs, are given by the numbers in the lower left corner of images. These redshifts are thought to be reliable at the moderate distances in question here. The figure is from Conselice et al. (2004).

# Some Structural Parameters

# Structural Parameters

## ① Colors and Magnitudes

## ② Sersic Parameters

- ① Surface brightness (central extrapolated or effective)
- ② Effective radius
- ③ Sérsic index

## ③ CASGM – Concentration, Asymmetry, Clumpiness, Gini coefficient, M20

- ① Concentration C28, C59
- ②  $A = (I - I_{180})/I$  (problems: center, noise, ETG)
- ③  $S = S - S_s$
- ④  $G$  (related to  $C$  and  $n$ )
- ⑤ M20 related to  $n$

## ④ New parameters

- ① skewness and kurtosis along major and minor axis
- ② wavelet power spectra → meansize, info.entropy

# Colors and Magnitudes

- ① global and core colors
- ② star formation
- ③ mass-to-light ratio → total mass estimate (Bell & de Jong 2001)
- ④ total mass

$$\log \left( \frac{\mathcal{M}_*}{L_B} \right) = -1.224 + 1.251(B - R)$$

$$\frac{\mathcal{M}_*}{L_B} = 10^{1.93(g-r)-0.79}$$

$$M - M_\odot = -2.5 \log(L/L_\odot)$$

$$z \approx \frac{v}{c} = \frac{d}{D_H} = \frac{dc}{H_0} \quad 0 < z \ll 1$$

$$\text{otherwise } z = z(H_0, \Omega_m, \Omega_k, \Omega_\Lambda)$$

# Sersic Parameters I

## Effective Radius and Surface Brightness

$I_n$  independent of distance in local Universe

$I_n$  gives a scale of density

$R_n$  gives a scale of size

both correlates with many other structural parameters

# Sersic Parameters II

## Sérsic index

- **Most important** morphological parameter for ETGs
- **Very difficult** to measure (1950-1990:  $n = 4$ )
- There is **no global** Sérsic index (Ferrari et al 2004)
- Related to formation and structure (merger history)
- discriminates bulge versus disk dominated
- fundamental plane  $(Rn, In, \sigma) \cup (n, L)$
- $\log(n)$  makes more sense

$n = 1 \rightarrow 2$  compares to  $n = 4 \rightarrow 8$

physical sequence  $n = \frac{1}{2}, 1, 2, 4, 8, 16$

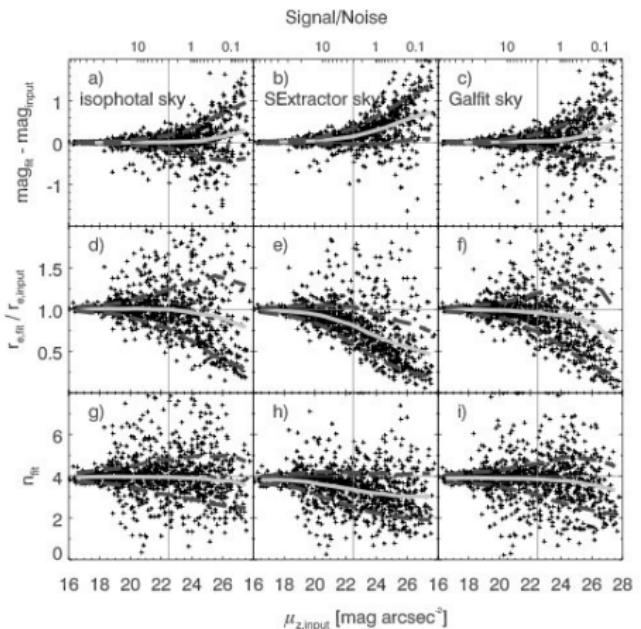
# Why $n$ is so important?

- $n$  correlates with  $R_n$ ,  $M_B$ ,  
(Caon et al 1993,..., Kormendy et al 2009)
- Merger remnants have higher Sérsic index  $n > 2$   
(e.g., F. Bournaud astro-ph/1106.1793)
- Sérsic index increases with number merger events (Kormendy et al 2009)
- Sérsic index correspond to different PDF  $f(\mathbf{r}, \mathbf{v})$  (Ciotti 1991)
- E – Sph dichotomy (Kormendy et al 2009)
- Stellar mass, size, and Sérsic index can predict the velocity dispersions  
(SDSS data, Bezanson et al 2011 ApJ **737** 31)

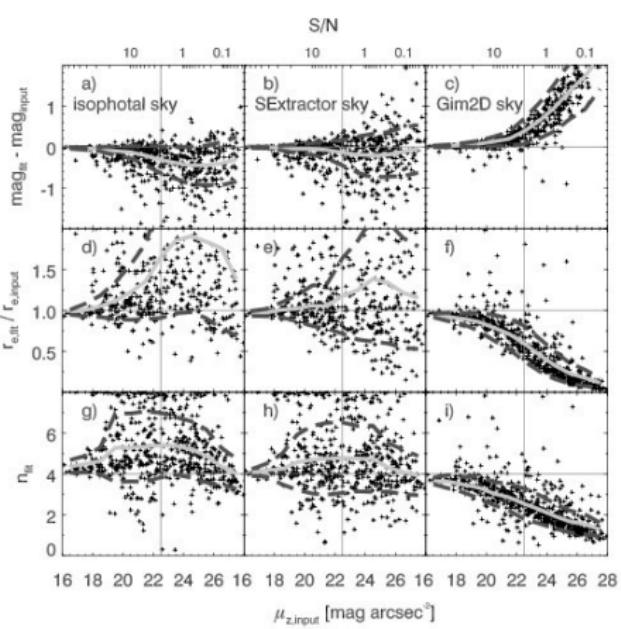
# Measuring Sersic Parameters |

$$n_{\text{input}} = 4$$

Häussler et al 2007, ApJS 172 615  
GEMS HST survey (Rix et al 2004)



GALFIT



GIM2D

# Measuring Sersic Parameters II

## Synthetic galaxies:

pure Sersic profiles 1000 images 255x255      no seeing      SNR=5

$$10 < I_n < 1000$$

$$5 < R_n < 15$$

$$1 < n < 10$$

$$0 < PA < 180$$

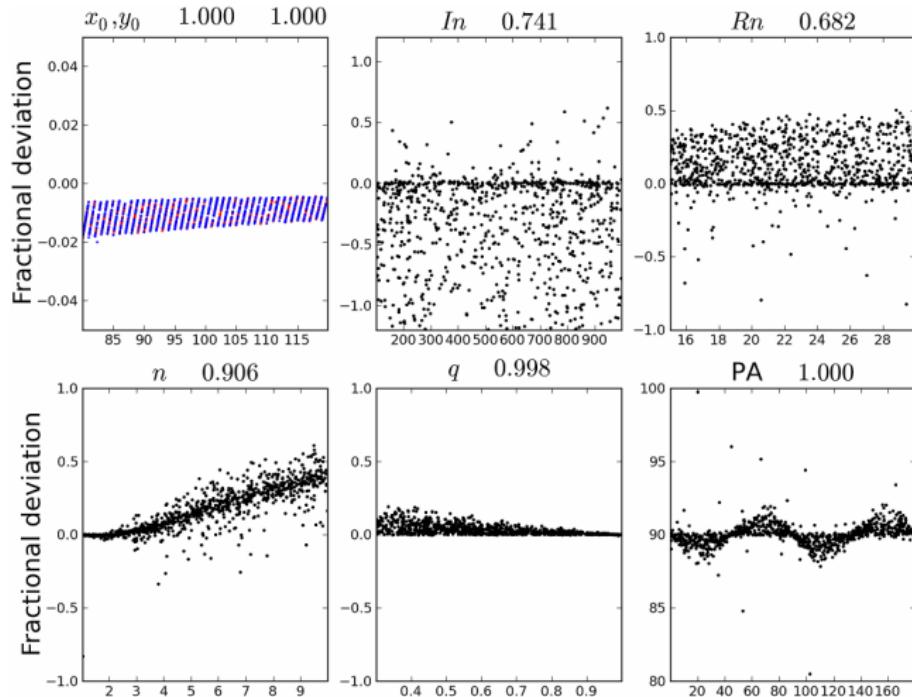
$$0.3 < q < 1.0$$

$$\text{fractional deviation } \varepsilon = \frac{P_{\text{in}} - P_{\text{out}}}{P_{\text{in}}}$$

# Measuring Sersic Parameters III

Galfit

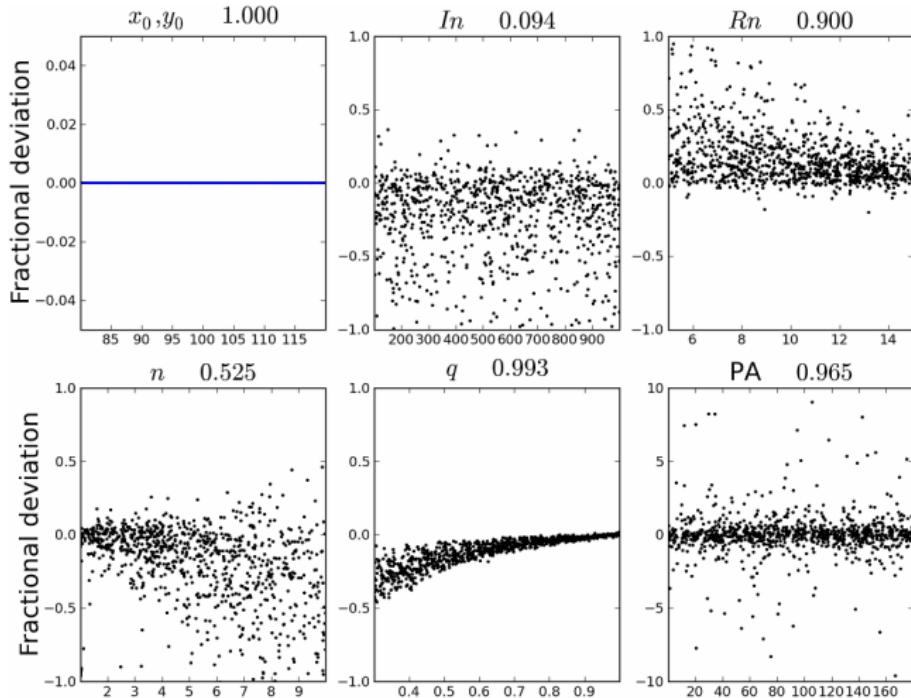
Peng et al. 2010, AJ 139 2097



# Measuring Sersic Parameters IV

our results – aperFFot

Ferrari 2012

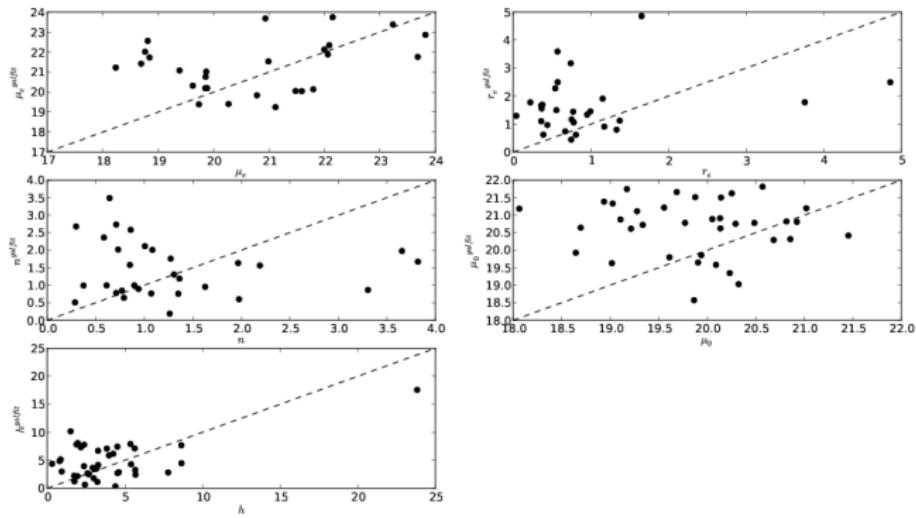


# Measuring Sersic Parameters V

GHASP Survey (OAM Marseille)

Carlos Eduardo Barbosa, IAG-USP

Galfit vs Homo Sapiens+IRAF+STSDAS+Ellipse



# Measuring Sersic Parameters VI

$I_n, R_n, n$  are very **difficult to measure** reliably

Measurements of  $I_n, R_n, n$  must be taken with **great care**

GALFIT (Peng 2010) and GIM2D (Simard 2002) are **alarming**.

# CASGM system

**Concentration** C Abraham et al. 1996

$$C_{28} = 5 \log \left( \frac{R_{80}}{R_{20}} \right) \quad C_{\text{disk}} = 2.7 \quad C_{\text{deVauc}} = 5.2$$

separate morphological type, correlates with mean stellar age

**Asymmetry** A Abraham et al. 1996

$$A = \frac{\sum_{i,j} |I_{i,j} - I_{ij}^{180}|}{\sum_{ij} |I_{ij}|} - B_{180}$$

**Smoothness** S Conselice 2003

$$S = \frac{\sum_{i,j} |I_{i,j} - I_{ij}^S|}{\sum_{ij} |I_{ij}|} - B_s$$

**Gini coefficient** G social index – depart from equal distribution

**M<sub>20</sub>** second order moment of 20% brightest pixels on image

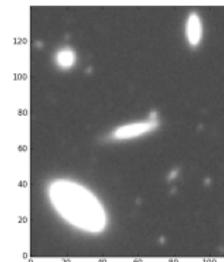
Lotz et al 2004

# Wavelet Transform I

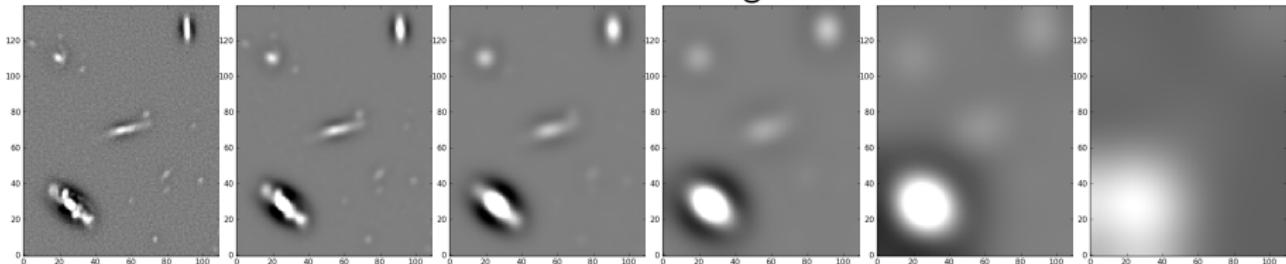
multiscale transform

$$S \equiv C_0 = C_J + \sum_i w_j \quad w_{j+1} = c_j - c_{j+1}$$

$c_j$  lowpass filtered signal at scale  $2^j$



original



wavelet transform

# Wavelet Transform II

multiscale transform

wavelet spectral density (power spectra) at scale  $\lambda_j = 2^j$

$$\Gamma(\lambda_j) = \sum_{pixels} w_{\lambda_j}^2$$

Mean size

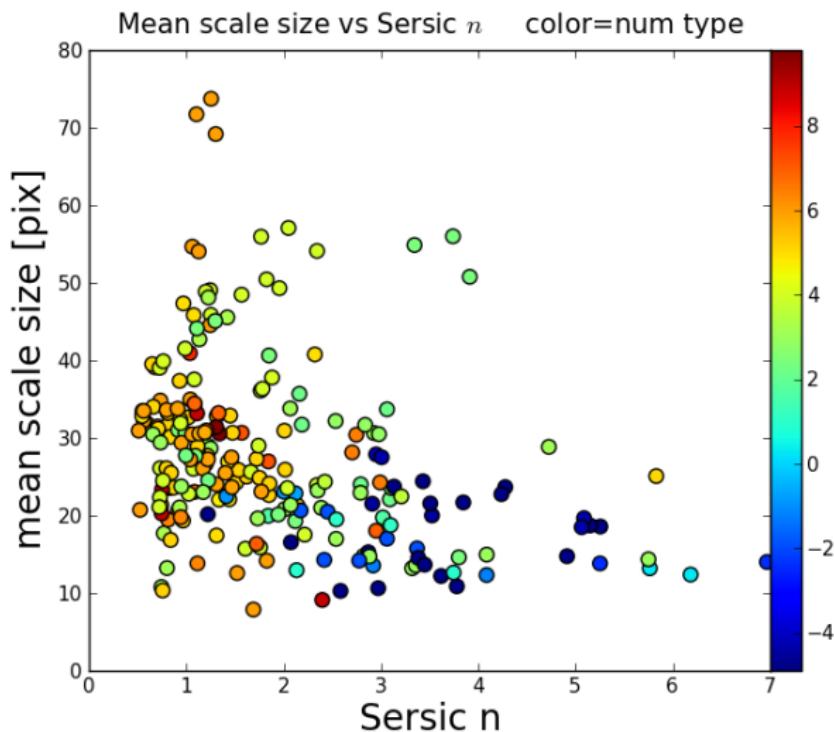
$$\bar{\lambda} = \sum_j \lambda_j \Gamma(\lambda_j)$$

Information entropy

$$\Theta = - \sum_j \Gamma(\lambda) \log(\Gamma(\lambda))$$

# Wavelet Transform III

multiscale transform



# Image Moments

$$M_{pq} = \int_{-\infty}^{\infty} \int_{-\infty}^{\infty} x^p y^q f(x, y) dx dy \quad \rightarrow \text{discrete} \rightarrow \quad M_{ij} = \sum_x \sum_y x^i y^j I(x, y)$$

Central Normalized Moments

$$\mu_{pq} = \frac{1}{M_{00}} \sum_x \sum_y (x - \bar{x})^p (y - \bar{y})^q I(x, y)$$

Scale Invariants

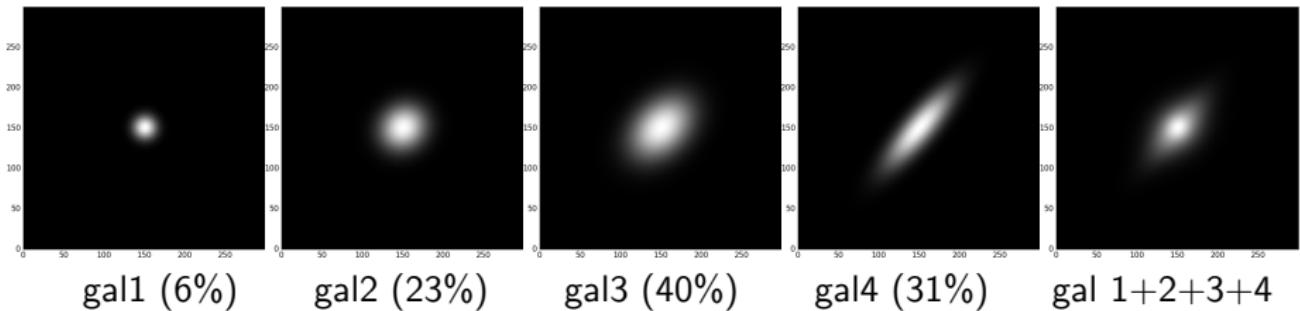
$$\eta_{ij} = \frac{\mu_{ij}}{\mu_{00}^{\left(1+\frac{i+j}{2}\right)}}$$

Translation, scale and rotation invariants – Hu (1962) set

$$I_1 = \eta_{20} + \eta_{02} \quad I_2 = (\eta_{20} - \eta_{02})^2 + (2\eta_{11})^2 \quad I_3 = \dots$$

**Convolution invariants** Flusser, Suk, Zitová 2009

## Synthetic example



model	not normalized			
	$\mu_{02}$	$\mu_{11}$	$\mu_{20}$	$\mu_{22}$
gal1	100	0	100	10 000
gal2	355	37	368	133 800
gal3	670	229	670	554 900
gal4	998	716	745	1 772 000
gal1234	662	319	587	795 700

In parameter distance space gal3 is the closest to gal1234

# Our approach

Develop a **fully automatic** algorithm to **measure structural parameteres**, correct and robust at low SNR and low spatial resolution, suited to process large photometric surveys.

next decade dominated by photometric data

few reliable tools to automatically perform photometry

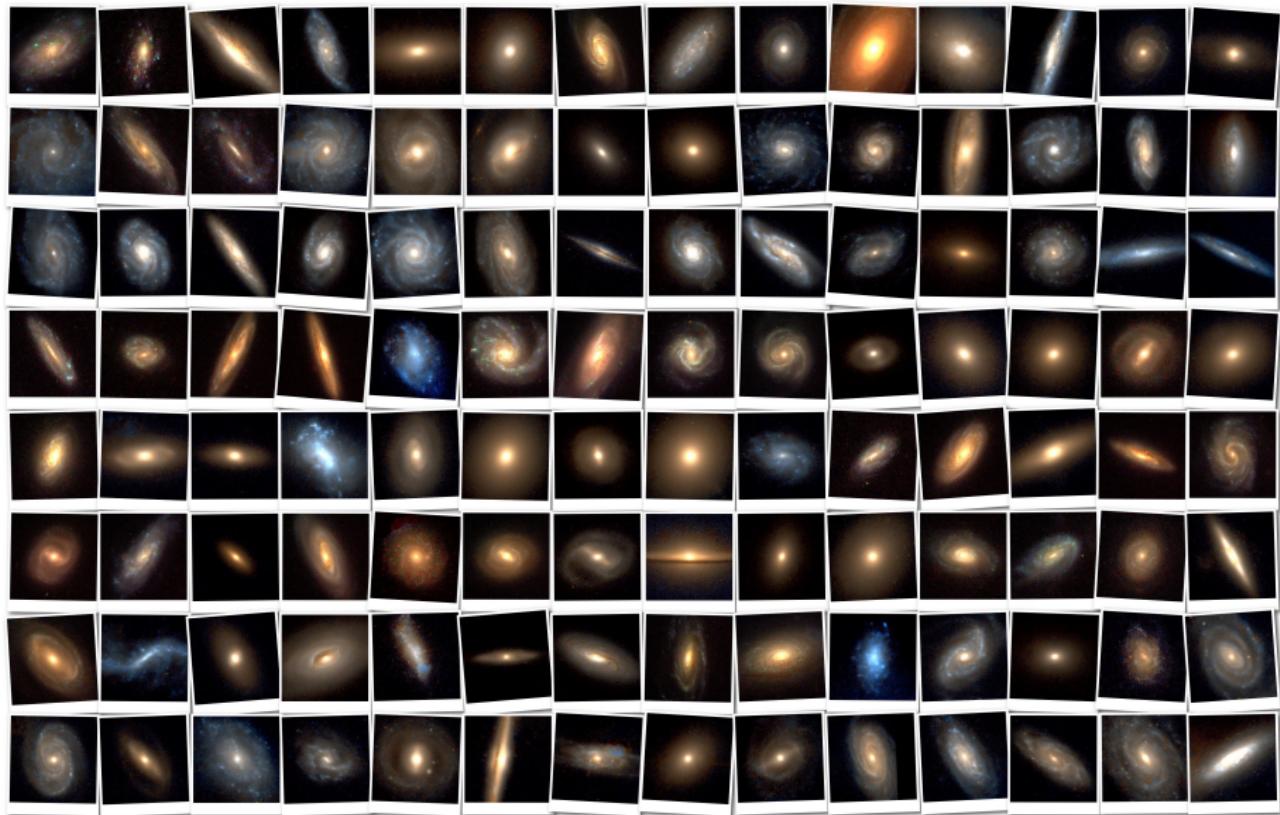
photometry is a complicated task

must to be done without human intervention

# Databases

- Frei 113 galaxies – simple clean known database (test)  
Frei 1996 AJ **111** 174
- EFIGI 5k SDSS eye-classified galaxies (test)  
A.Baillard, E.Bertin, et al. 2011
- **SPIDER** (SDSS/UKIDSS)  $\sim$ 50k ETGs  
F. La Barbera, R.R. de Carvalho et al 2010 MNRAS 408 1313  
39 993 Bright ( $^{0.1}M_r < -20$ ) ETG *griz* SDSS-DR6 bands  
many measured physical parameters (magnitudes, Starlight<sup>TM</sup>, ...)  
 $0.05 < z < 0.095$
- JPAS-Pau Brasil collaboration  
 $10^8$  galaxies in 40 filters (2014)  
analysis in the same rest frame  $\lambda_0$  for some  
 $z \lesssim 1$
- DES database

# Frei database overview



Created by Zoltán Frei and James E. Gunn Copyright © 1999 Princeton University Press

# Why 1D photometry? I

- does not assume any functional form for  $I(R)$
- there is no global Sérsic index, 1D can recover  $n_a$  and  $n_b$
- faster and more robust than 2D

# Why 1D photometry? II

## The relationship between the Sérsic law profiles measured along the major and minor axes of elliptical galaxies\*

F. Ferrari<sup>1†</sup>, H. Dottori<sup>1</sup>, N. Caon<sup>2</sup>, A. Nobrega<sup>1,3</sup>, D. B. Pavani<sup>1‡</sup>

<sup>1</sup> Instituto de Física – UFRGS, Av. Bento Gonçalves, 9500, Porto Alegre, RS, Brazil.

<sup>2</sup> Instituto de Astrofísica de Canarias, Via Lactea, E-38200 La Laguna, Tenerife, Canary Islands, Spain.

<sup>3</sup> CETEC – UNOCHAPECÓ, Av. Senador Atílio Fontana, s/n, Chapecó, SC, Brazil.

$$\mu(R) = A + B R^{\frac{1}{n}} \quad \frac{d\mu(b)}{db} = \frac{1}{\mathcal{F}(a)} \frac{d\mu(a)}{da}$$

constant eccentricity

$$\mu(b) = A_a + \frac{B_a}{e_c} b^{1/n_a}$$

variable eccentricity

$$e(a) = e_0 + (e_1 - e_0) \left( \frac{a}{a_M} \right)^l,$$

$$\mu_L(b) = A_a + \frac{B_a}{e_0 n_a l} a^{1/n_a} \Phi \left( 1 - \frac{\mathcal{F}(a)}{e_0} ; 1 ; \frac{1}{n_a l} \right)$$

# Background, segmentation, resampling, star masking I

## Background

median of corner values

## Segmentation

- lowpass filter galaxy (filter width  $\simeq \text{image\_size}/10$ )
- threshold at  $\bar{I} + \kappa \sigma_I$  ( $\kappa \sim 0.2$ )
- connect component label regions

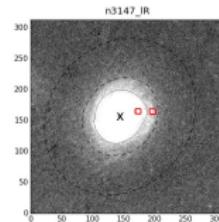
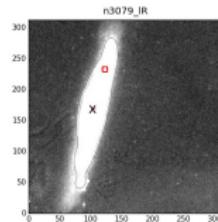
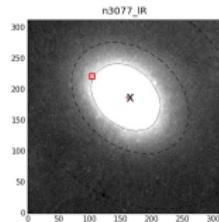
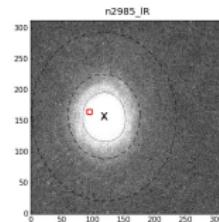
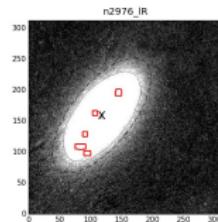
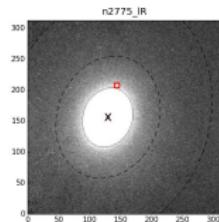
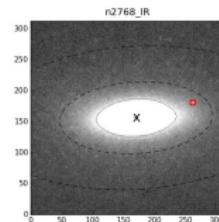
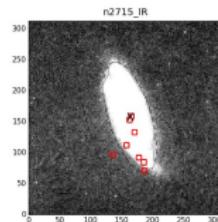
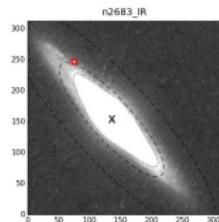
## Resample

- to subpixel precision

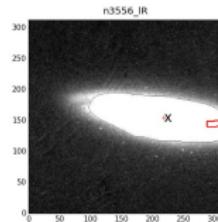
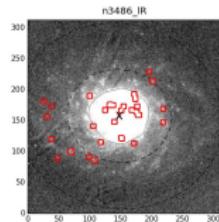
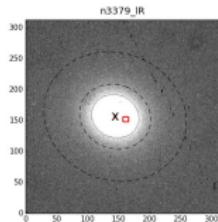
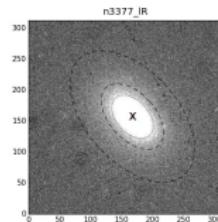
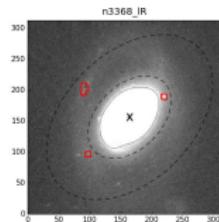
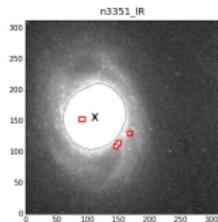
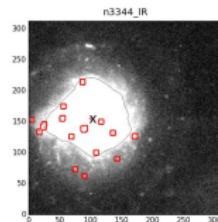
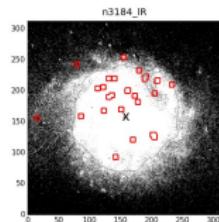
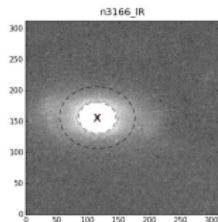
## Geometric parameters

- $x_{\text{peak}}, y_{\text{peak}}, a, b, PA$  to measure profile

# Background, segmentation, resampling, star masking II



# Background, segmentation, resampling, star masking III



# Geometrical Moments

center of mass, standard deviation, skewness, kurtosis

peak of lowpass filtered image  $x_{\text{peak}}, y_{\text{peak}}$

$$\text{center of mass } x_0 = \frac{m_{10}}{m_{00}} \quad y_0 = \frac{m_{01}}{m_{00}}$$

semiaxes are eigenvalues from

$$\mathbb{J} = \begin{pmatrix} \mu_{20} & \mu_{11} \\ \mu_{11} & \mu_{02} \end{pmatrix}$$

Axis ratio  $q = b/a$

Position Angle

$$PA = \frac{1}{2} \arctan(2\mu_{11}, \mu_{20} - \mu_{02})$$

$$\text{skewness } \zeta_3^x = \frac{\mu_{30}}{\sqrt{\mu_{20}^3}}$$

$$\text{kurtosis } \zeta_4^x = \frac{\mu_{40}}{\mu_{20}^2}$$

# Luminosity profile I

- ①  $sma \in [R_{min}, R_{max}, dR]$
- ② ellipse  $e_i$  centered at  $(x, y)_{peak}$ , width  $dR$
- ③ size  $sma$ , axis ratio  $q$
- ④ mask stars:  
substitute pixels with  $I_* > \langle I \rangle + k \sigma_I$        $k = 5$   
by the mean of isophote.
- ⑤ measure  $I$  (over  $e_i$ ),  $\overline{I}$  (inside  $e_i$ ),  $L_T$  (inside  $e_i$ )
- ⑥ cut the profile at  $2 R_p$

Petrosian Radius

$$\eta(R_p) = 5 \quad \eta(R) = \frac{\langle I \rangle(R)}{I(R)}$$

# Single Sérsic fit |

## Optimization

Penalised least square fit

$$\chi = \sum_i \frac{\mu_i^{\text{obs}} - \mu_i^{\text{mod}}}{\sigma_\mu}$$

points with large errors  $\sigma_i$ ; weight less

## Goodness of fit

Fractional deviation

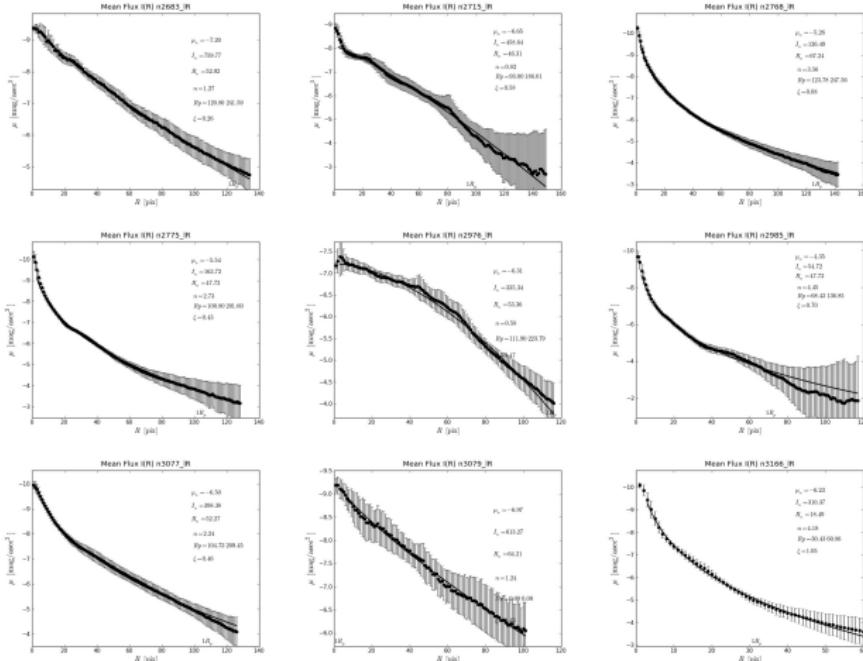
$$\xi = \sum_i \frac{\mu_i^{\text{obs}} - \mu_i^{\text{mod}}}{\mu_i^{\text{mod}}}$$

Error weighted fractional deviation

$$\xi = \sum_i w_i \frac{\mu_i^{\text{obs}} - \mu_i^{\text{mod}}}{\mu_i^{\text{mod}}} \quad w_i = \frac{\sigma_\mu}{\langle \sigma_\mu \rangle}$$

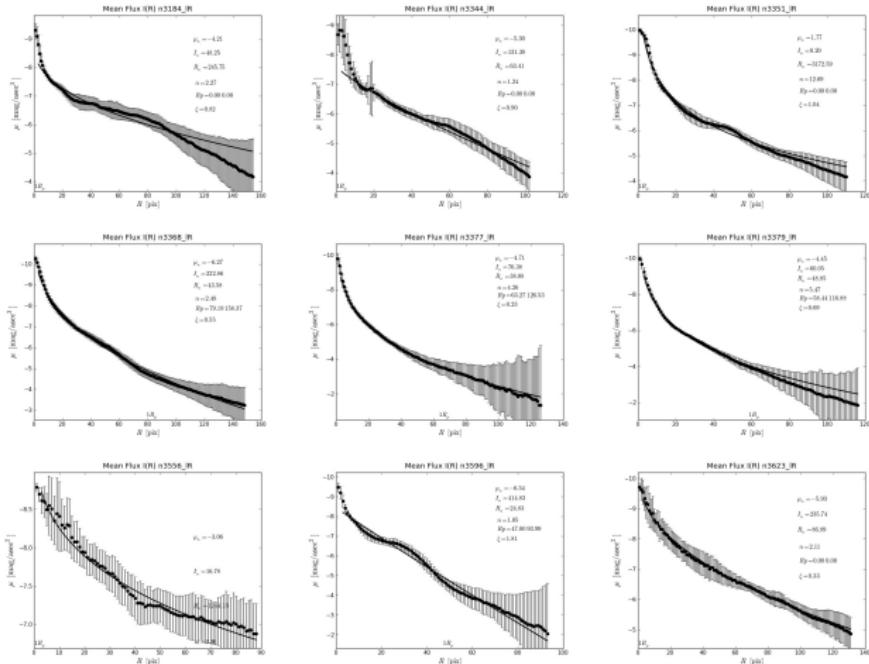
# Single Sérsic fit II

Frei data



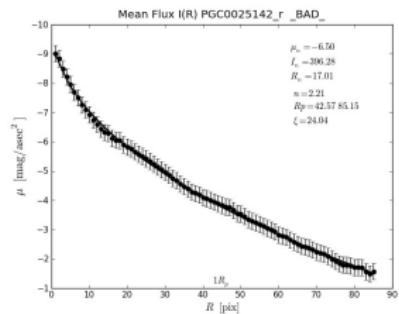
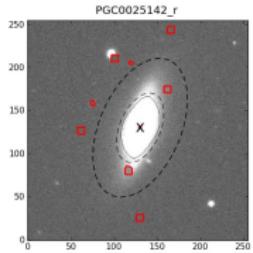
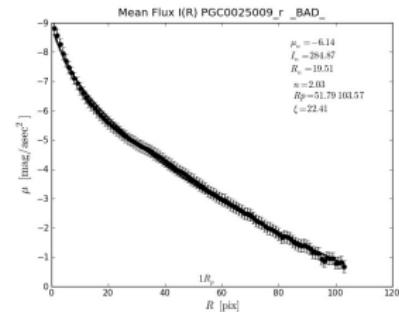
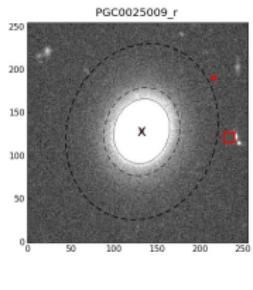
# Single Sérsic fit III

Frei data



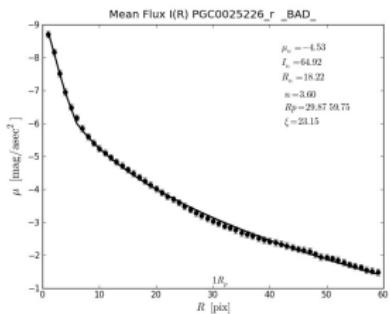
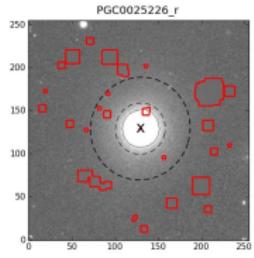
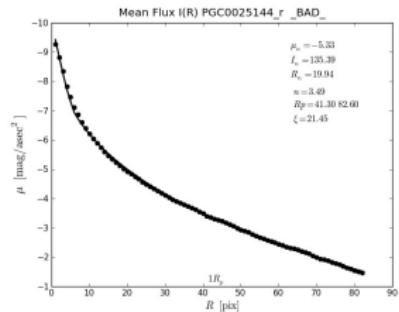
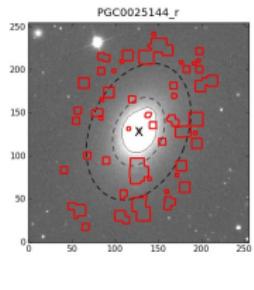
# Single Sérsic fit IV

## EFIGI data



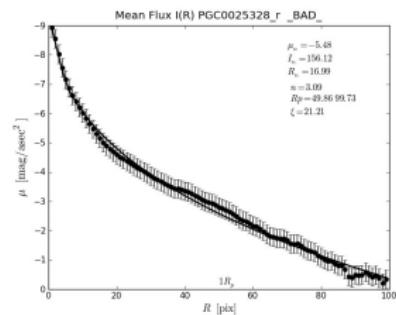
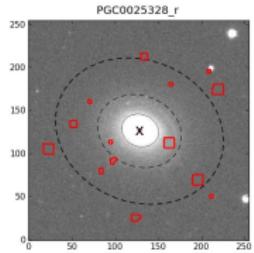
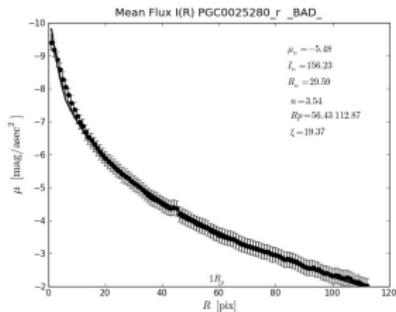
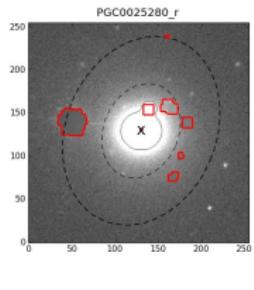
# Single Sérsic fit V

EFGLI data



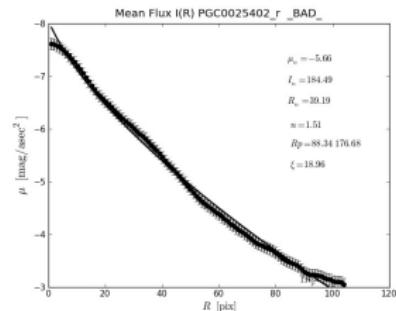
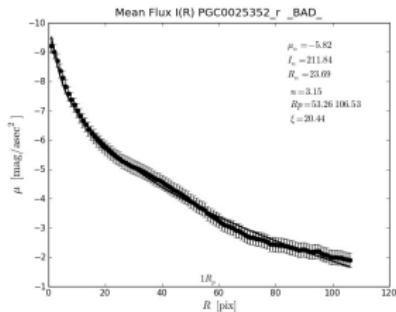
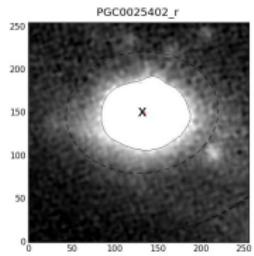
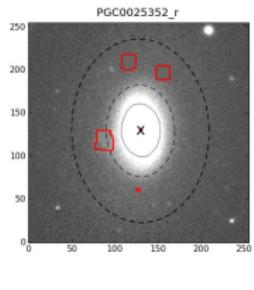
# Single Sérsic fit VI

## EFIGI data



# Single Sérsic fit VII

## EFIGI data



# Next Steps

- Seeing effects
- Ellipse fitting (superellipse, Fourier coefs)
- Standard data (axis ratio=1, PA=0, same  $\bar{I}$ ,  $\sigma_I$ )
- Apply dynamically motivated luminosity profiles  
(G.Brum & F.Ferrari, **poster 48**, this conference)
- Multivariate data analysis with measured parameters  
(PCA, ICA, Factor, Discriminant)
- Alternative techniques :
  - Cladistics/Taxonomy
  - Nearest neighbor tree
  - Cluster finding

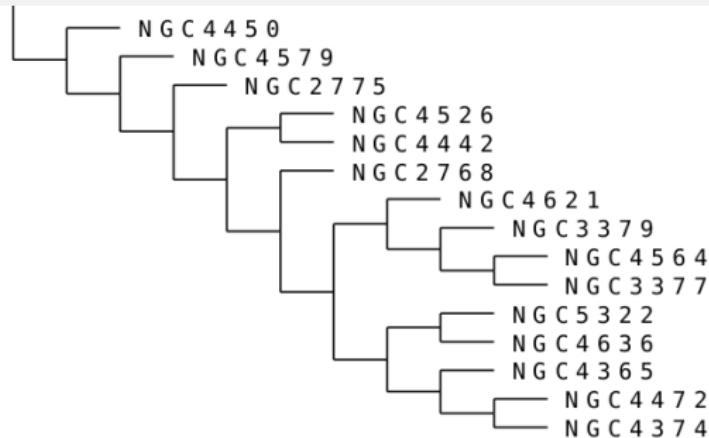
# Cladistics

parameters

$t$     $lc$     $(b - v)_t$     $V_{\max}^{\text{gas}}$     $\sigma$     $B_{\text{mag}}$     $C_r$     $A_r$     $S_r$     $G_r$     $M20r$     $In$     $Rn$     $n$     $q$     $PA$     $Rp$     $C$

**parsimony:** least evolutionary change to explain the data

"ellipticals" clade (branch)

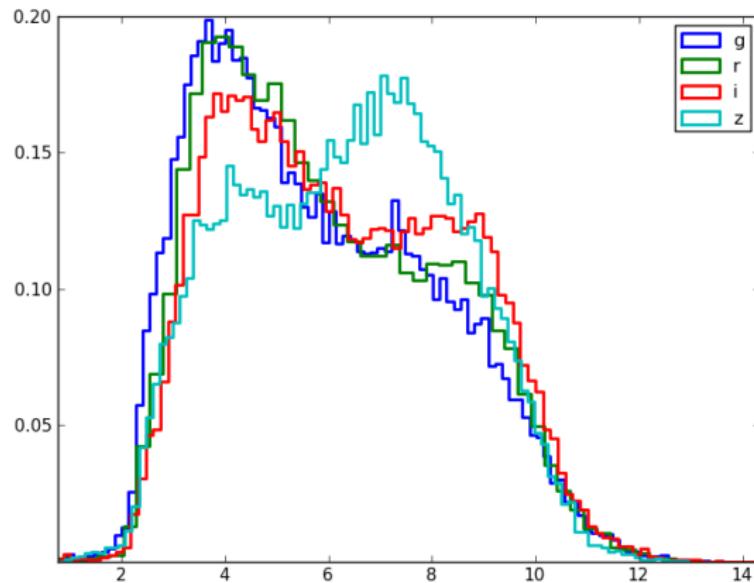


analysis courtesy **Augusto Ferrari**, Zoology Dept., Bioscience Institute, UFRGS.

# Bimodality in concentration between ETG

SPIDER database  
Early-type galaxies

Sersic index  $n$



# Costs I

## Linux + Python + Scipy

300x300 pixels image

ACTION	DURATION
★ find object, retrieve data	.3 s
★ brightness profile with aperture photometry	1 s
★ fit brightness profile	0.5 s
★ moments calculation	0.1 s
● wavelet transform (6 scales)	3 s
total	5 s

## Costs II

laptop @ home, using a single core

$10^4$  obj: 13h

$10^5$  obj: 5 days

$10^6$  obj: 2 months

laptop @ home, using 4 cores

$10^4$  obj: 3.5h

$10^5$  obj: 1.5 day

$10^6$  obj: 14 days

optimizing OpenMP: (L.Ferreira & F. Ferrari, **poster 50**, this conference)

$10^6$  obj: 1 day

# Conclusions

- Hubble fork apply to local Universe
  - galaxies grow, merge, evolve
- two component in galaxies:
  - red, pressure dominated, concentrated component
  - blue, rotationi dominated, extended component
  - mass is determinant
- nuclear and global properties correlate → evolve together
- Sérsic parameters are **very important**  
they are **very difficult** to measure
- we need to classify (understand) galaxies with new parameters
  - CASGM system
  - Wavelet, moments, inform. entropy, ...
- new techniques
  - multivariate data analysis
  - cladistics, taxonomy, cluster

thanx