

# CHEF bases for astronomical data analysis

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## The era of big data



ALHAMBRA  
SURVEY

XDF

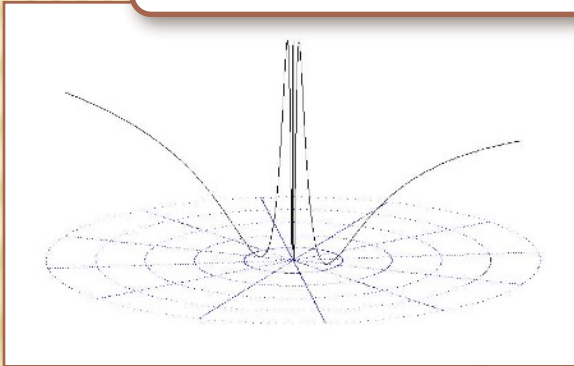
- J-PAS expectations: measuring 100M galaxies and a few million quasars with  $dz/(1+z) \sim 0.003$  and 300M galaxies with  $dz/(1+z) \sim 0.01$



The CHEF polar basis is **separable** in  $r$  and  $\theta$   
(Jiménez-Teja & Benítez, 2012)

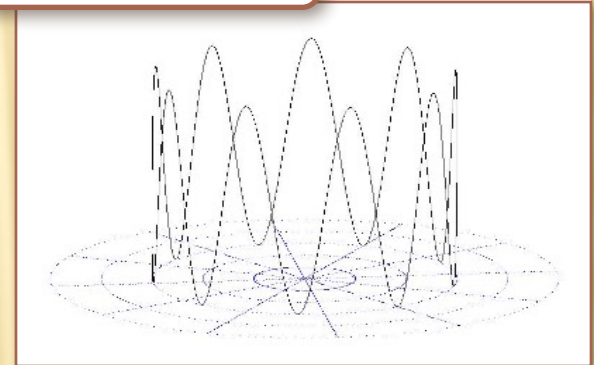
Chebyshev rational functions in  $r$

$$TL_n(r;L) = T_n\left(\frac{r-L}{r+L}\right)$$



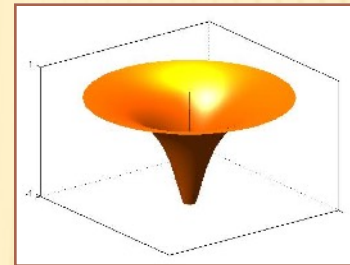
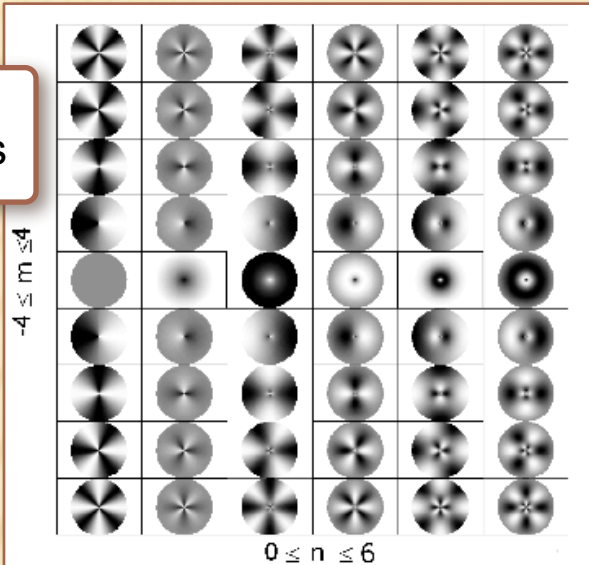
Fourier series in  $\theta$

$$e^{im\theta}$$

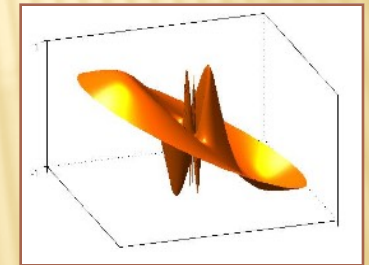


$$\{\phi_{nm}(r,\theta;L)\}_{nm} = \left\{ \frac{1}{C\pi} TL_n(r;L) e^{im\theta} \right\}_{nm}, \text{ with } C = \begin{cases} \sqrt{2}, & \text{if } n = 0 \\ 1, & \text{cc.} \end{cases}$$

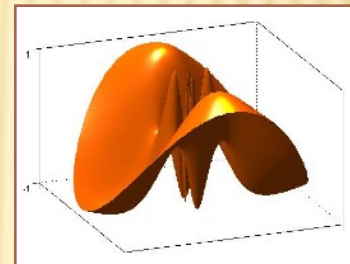
Real components



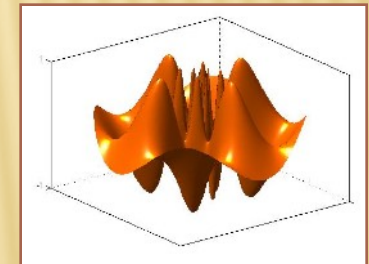
$$n = 2, m = 0$$



$$n = 6, m = 1$$

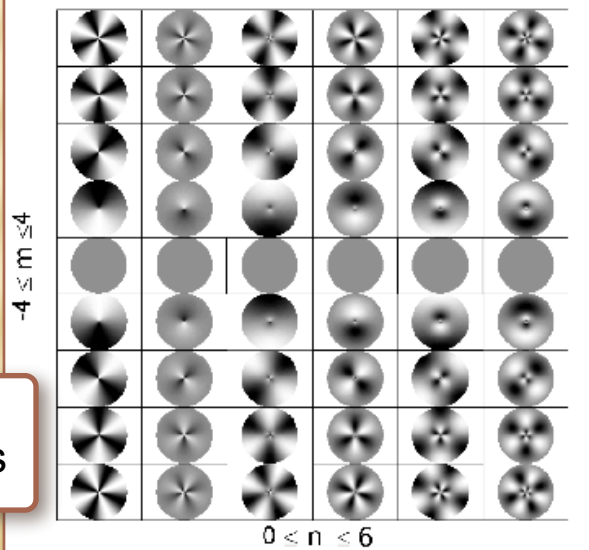


$$n = 6, m = 2$$

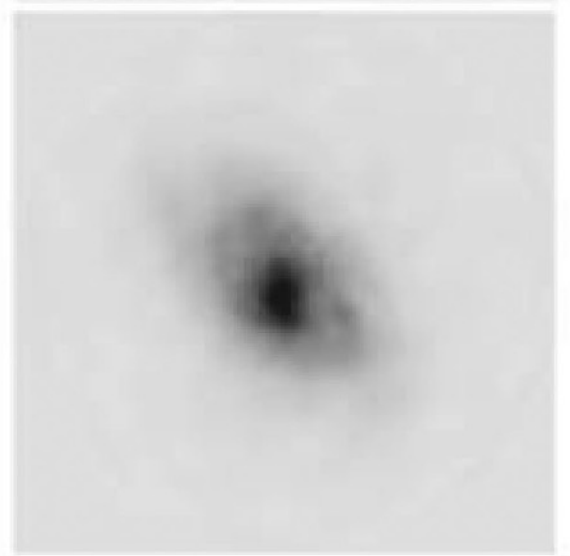
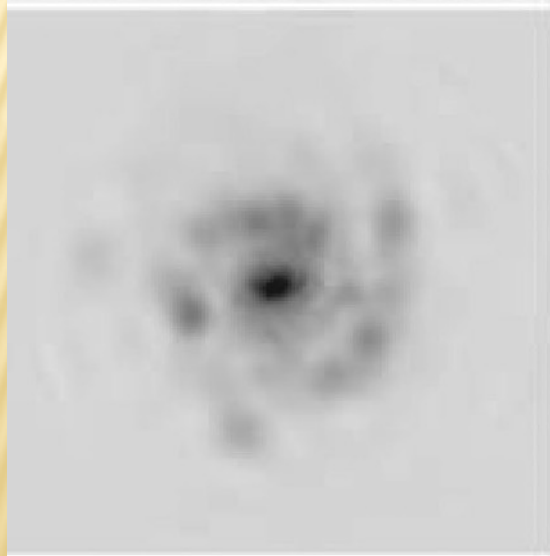
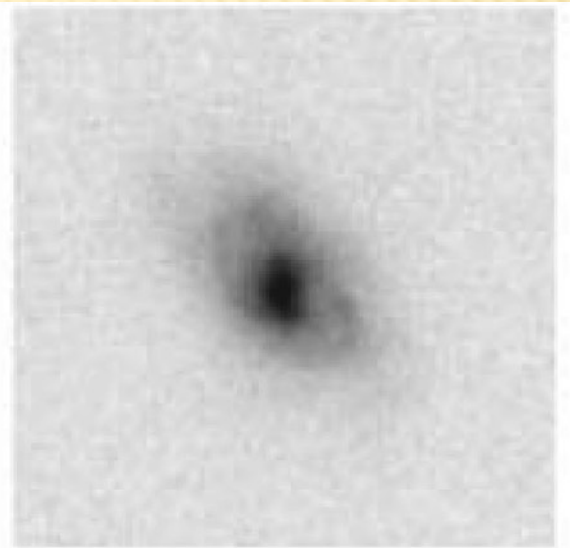
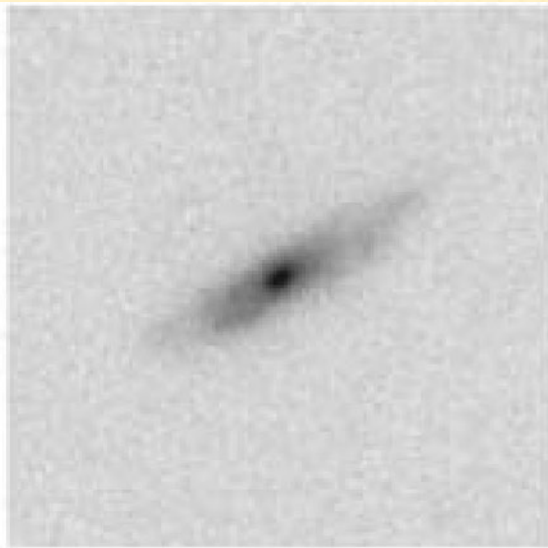
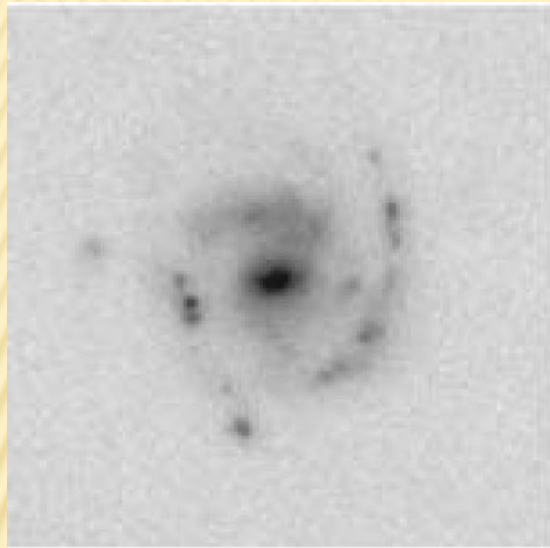


$$n = 10, m = 4$$

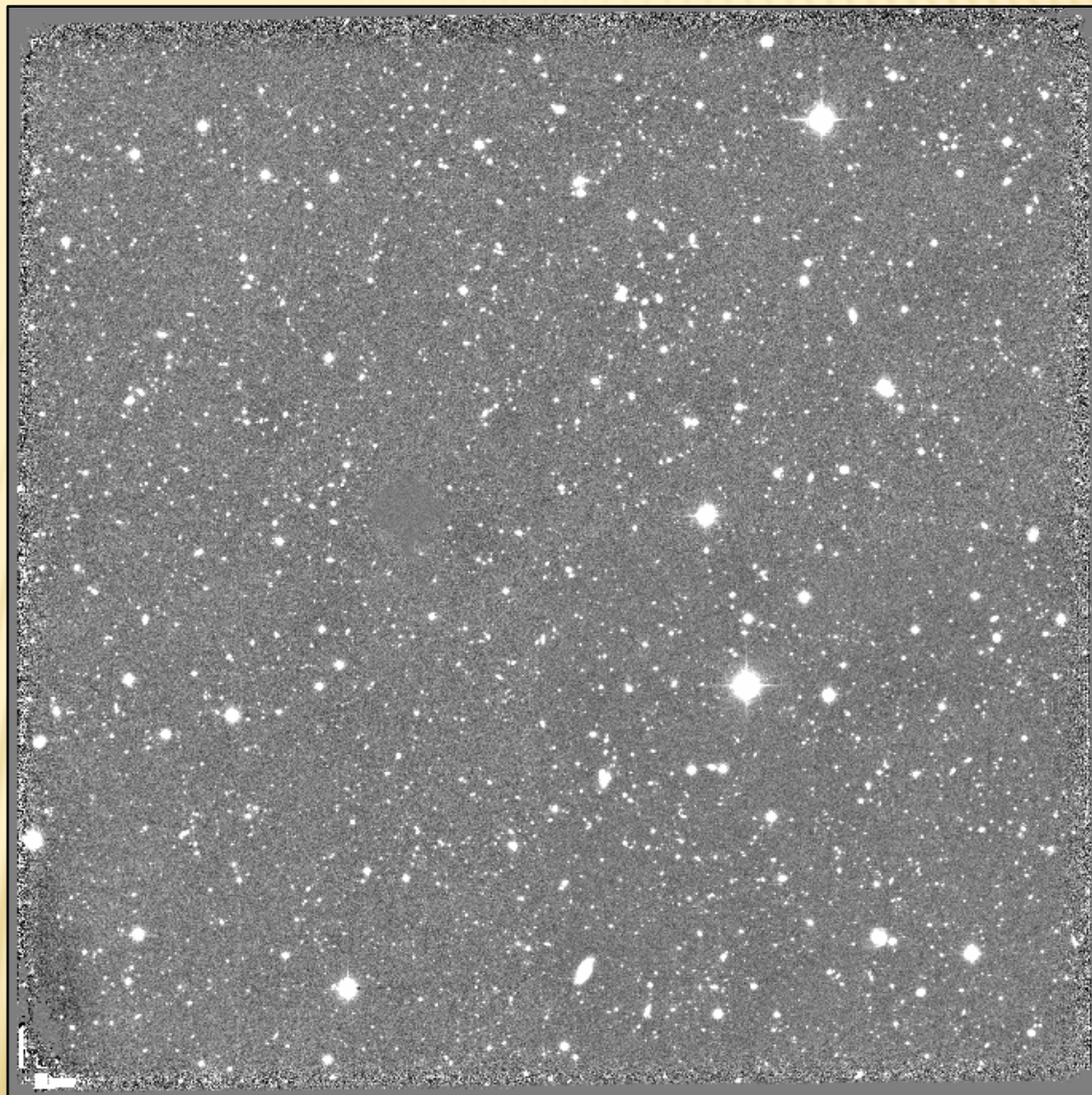
Imaginary components





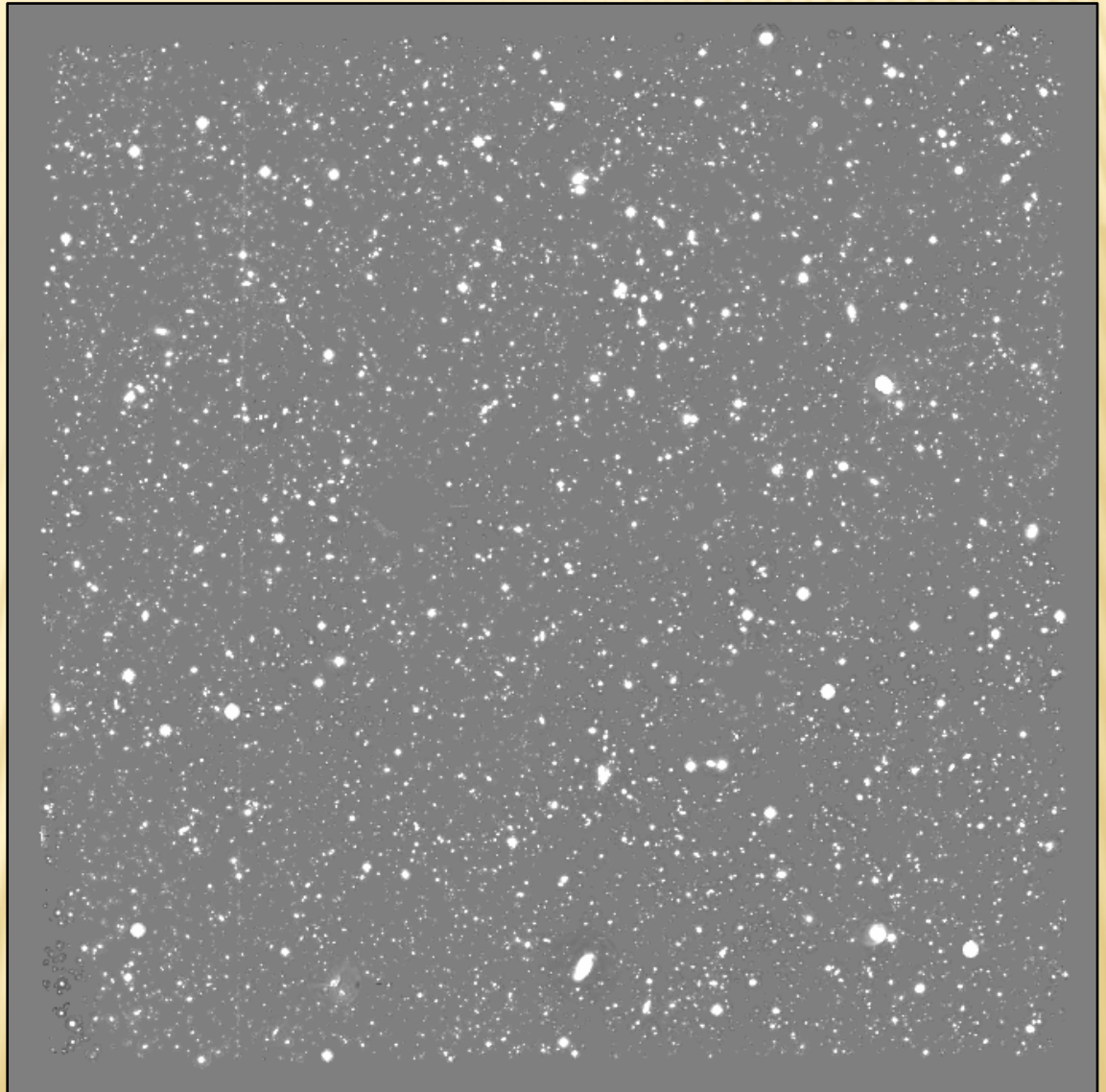


**ALHAMBRA field #5:  
Original F814W**



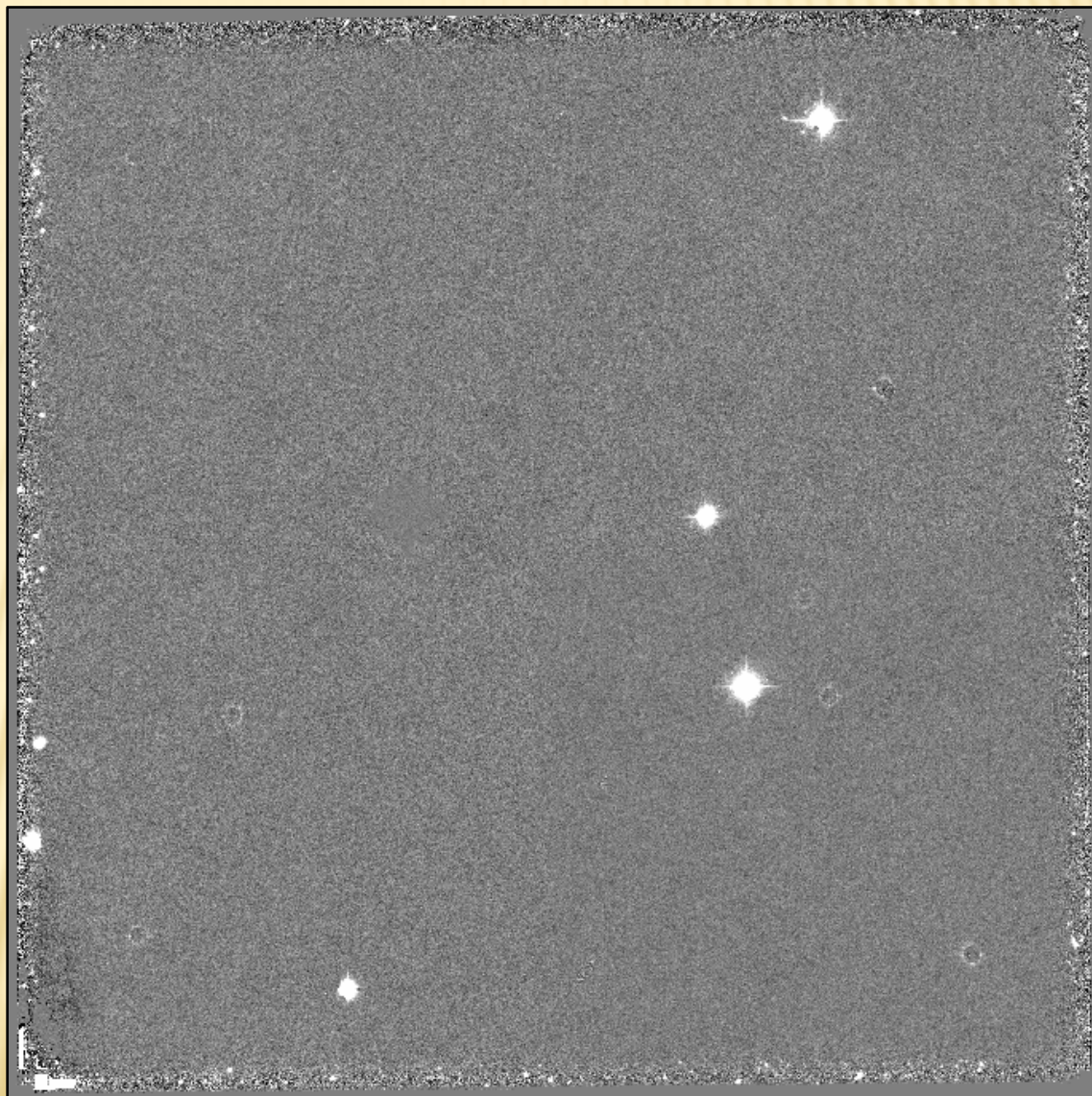


**ALHAMBRA field #5:  
CHEF model**

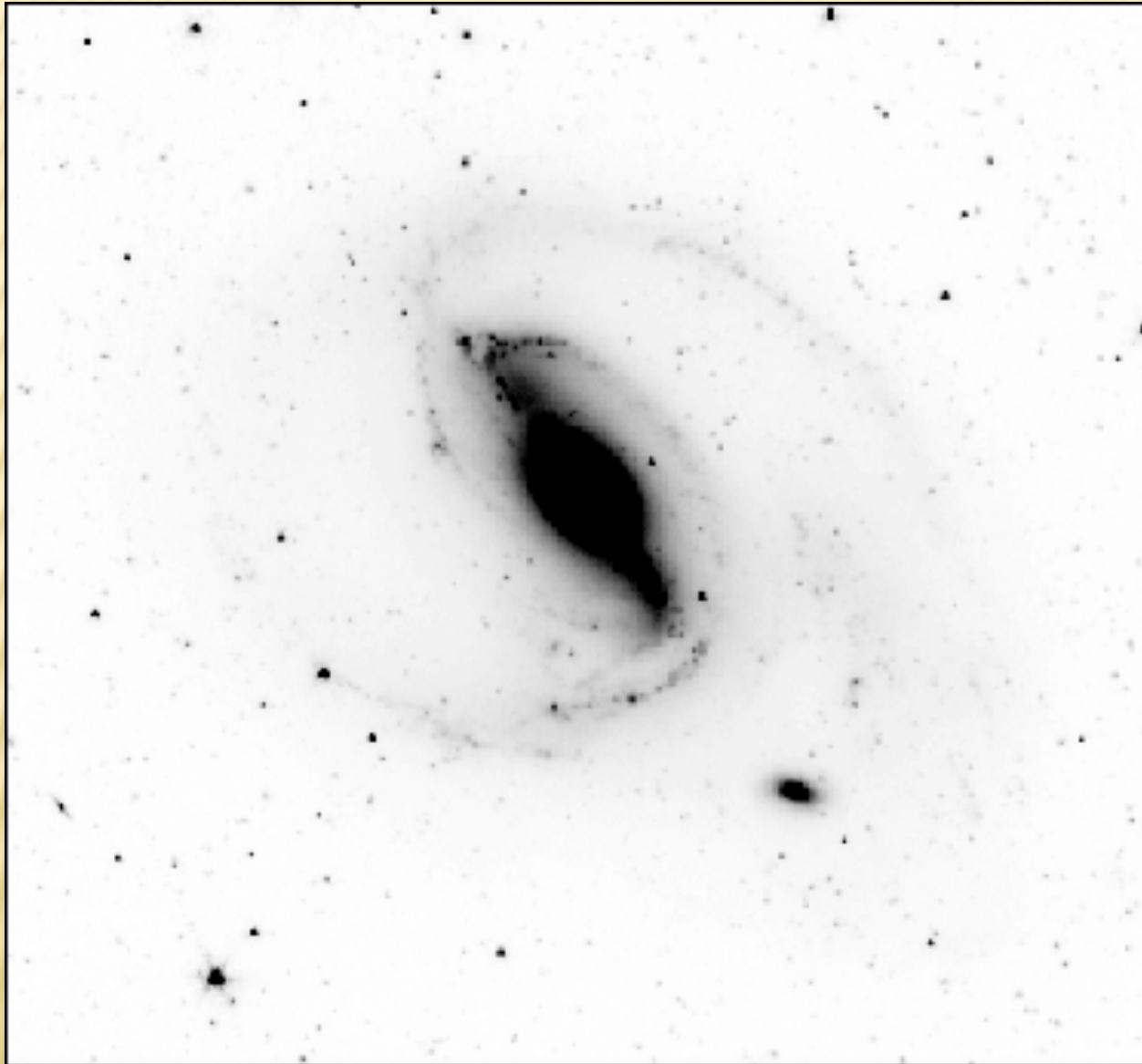




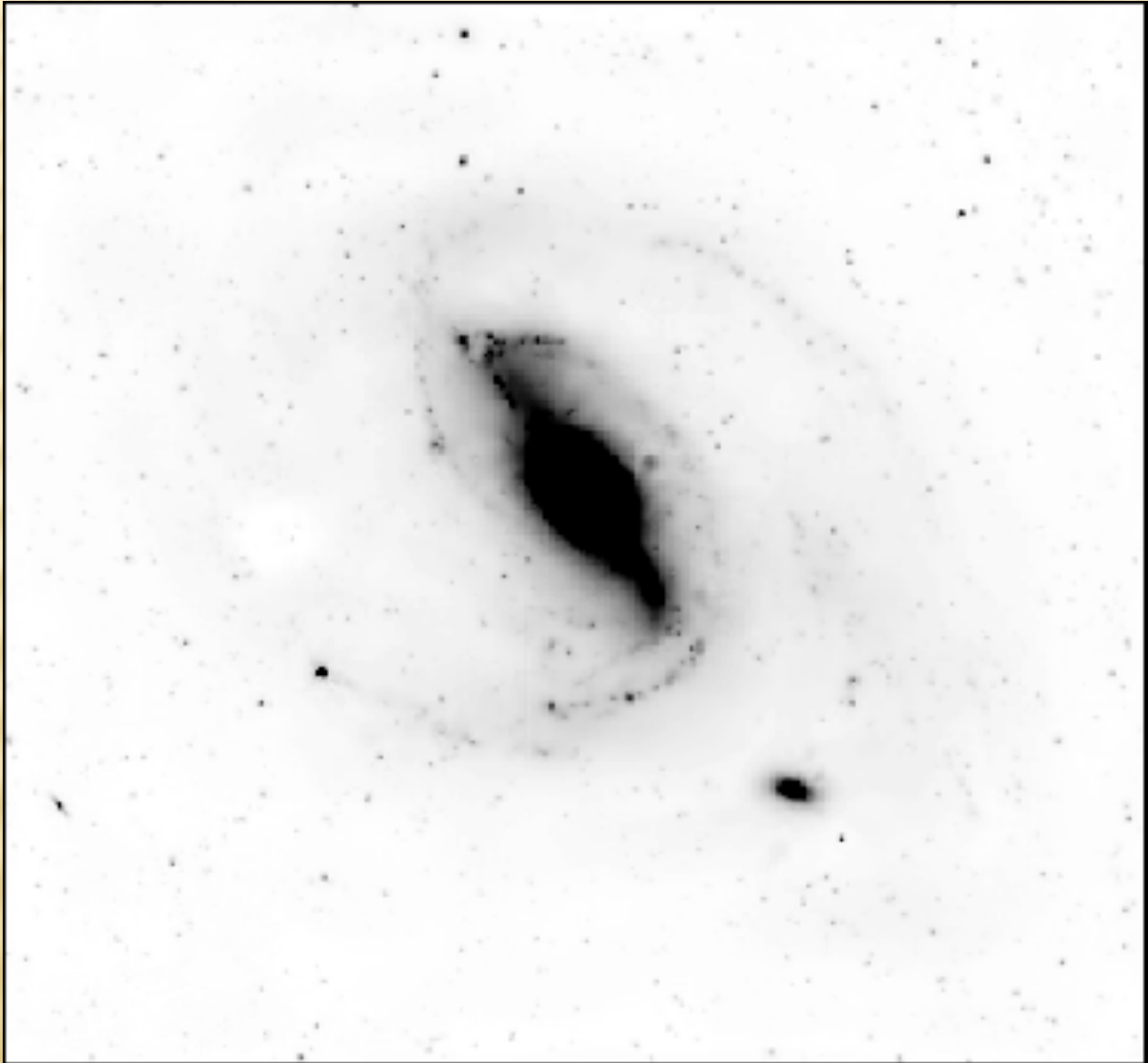
**ALHAMBRA field #5:  
Residual**





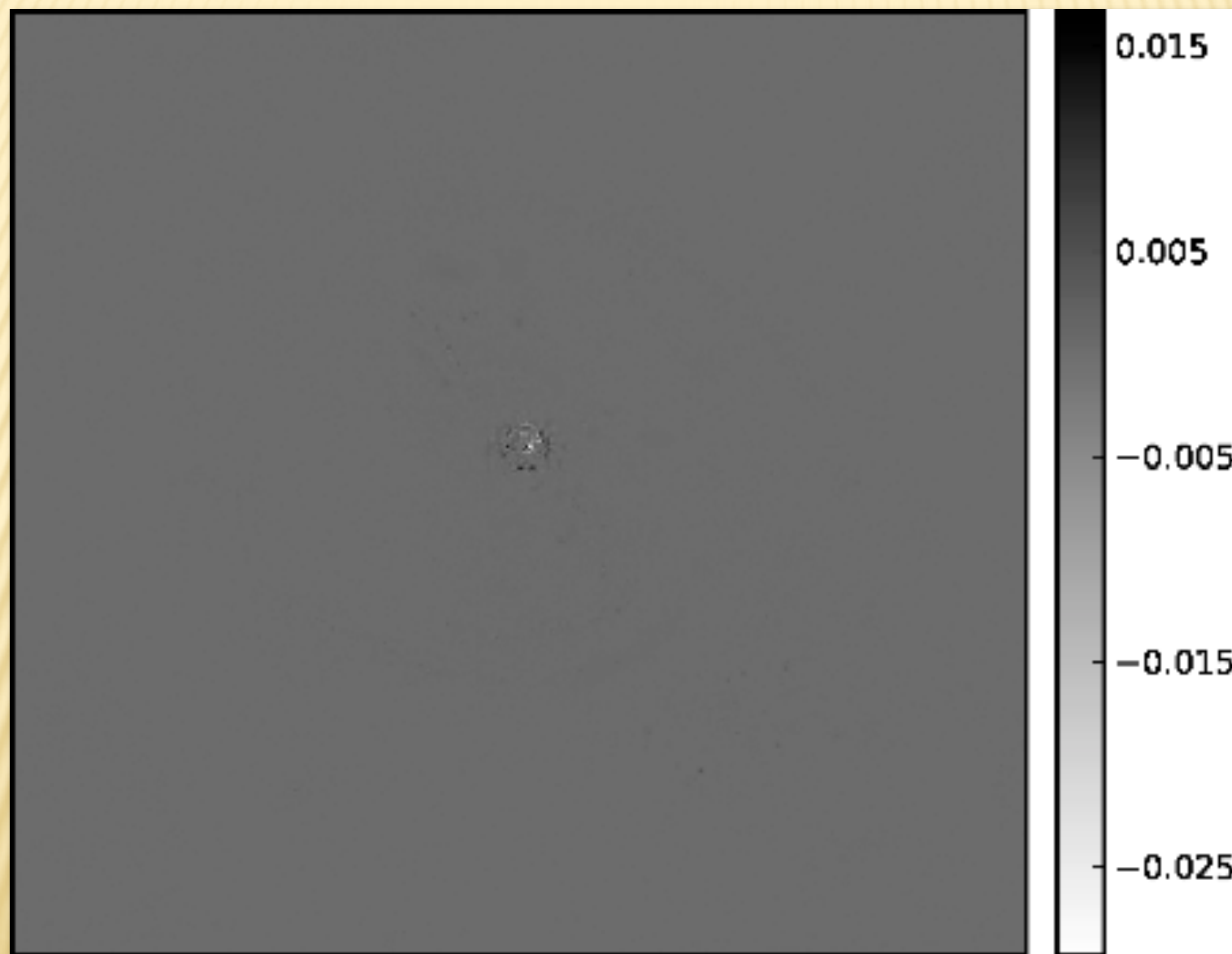


**NGC 1097**



**CHEF model**





## Measuring photometry and morphology using the CHEF coefficients (Jiménez Teja & Benítez, 2012)

$$I_p^n = \begin{cases} 2 \sum_{j=0}^n \binom{n}{j} (-1)^j L^{-j/2} \frac{R^{p+j/2+1}}{2p+j+2} \operatorname{Re} \left[ e^{in\pi/2} i^{n+j} {}_2F_1 \left( n, 2p+j+2, 2p+j+3; \frac{-i\sqrt{R}}{\sqrt{L}} \right) \right], & \text{if } n > 0 \\ \frac{R^{p+1}}{p+1}, & \text{if } n = 0 \end{cases}$$

**Flux:**  $F = 2\pi \sum_{n=0}^{+\infty} f_{n,0} I_1^n$

**Rms radius:**  $R^2 = \frac{2\pi}{F} \sum_{n=0}^{+\infty} f_{n,0} I_3^n$

**Centroid:**  $x_c + iy_c = \frac{2\pi}{F} \sum_{n=0}^{+\infty} f_{n,1} I_2^n$

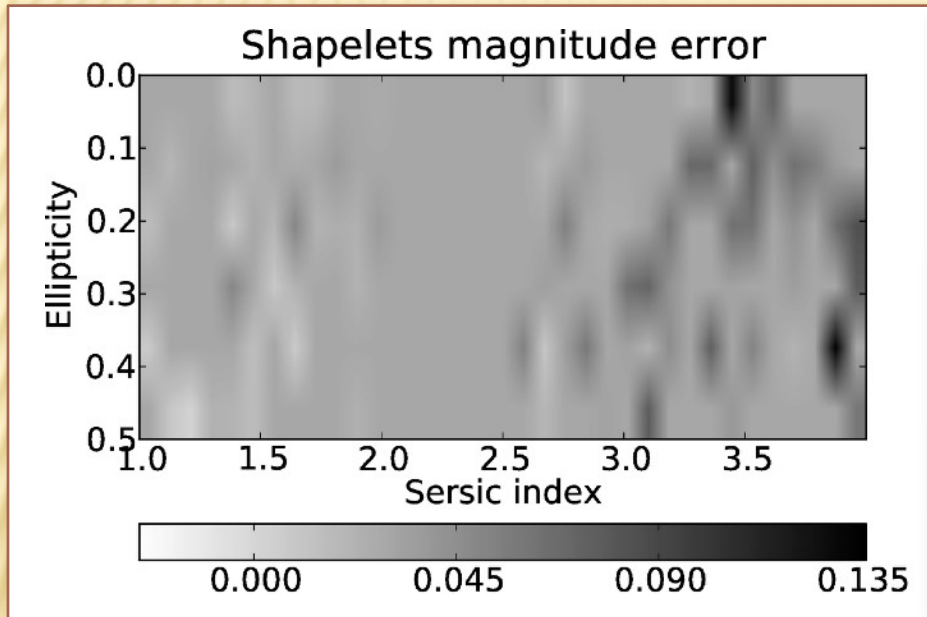
**Ellipticity:**  $e = \frac{\sum_{n=0}^{+\infty} f_{n,-2} I_3^n}{\sum_{n=0}^{+\infty} f_{n,0} I_3^n}$

**Shear estimator:**

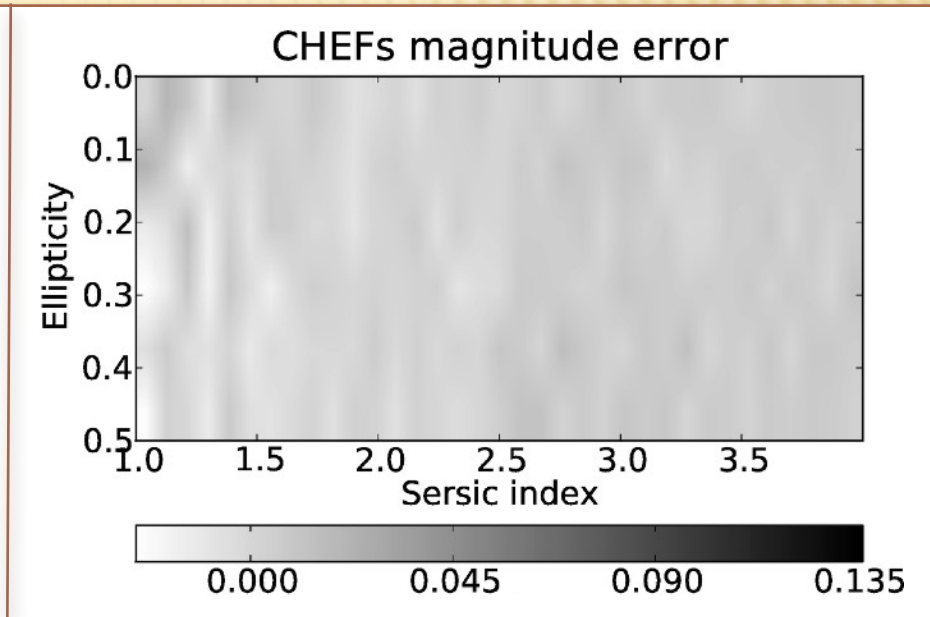
$$\varepsilon = \frac{\sum_{n=0}^{+\infty} f_{n,-2} I_n^3}{\sum_{n=0}^{+\infty} f_{n,0} I_n^3 + \frac{\sqrt{2}}{2} \left[ \sum_{i,j=0}^{+\infty} (-f_{i,-2} f_{i,2} - f_{i,2} f_{j,-2} + (f_{i,-2} + f_{i,2} + f_{i,0}) f_{j,0} + (f_{j,-2} + f_{j,2} + f_{j,0}) f_{i,0}) I_3^i I_3^j \right]^{1/2}}$$



Sample of 350 mock galaxy images of 100x100 pixels, with Sérsic profiles whose index ranges from 0.5 to 4 and sheared with different levels of ellipticity. Gaussian noise added.

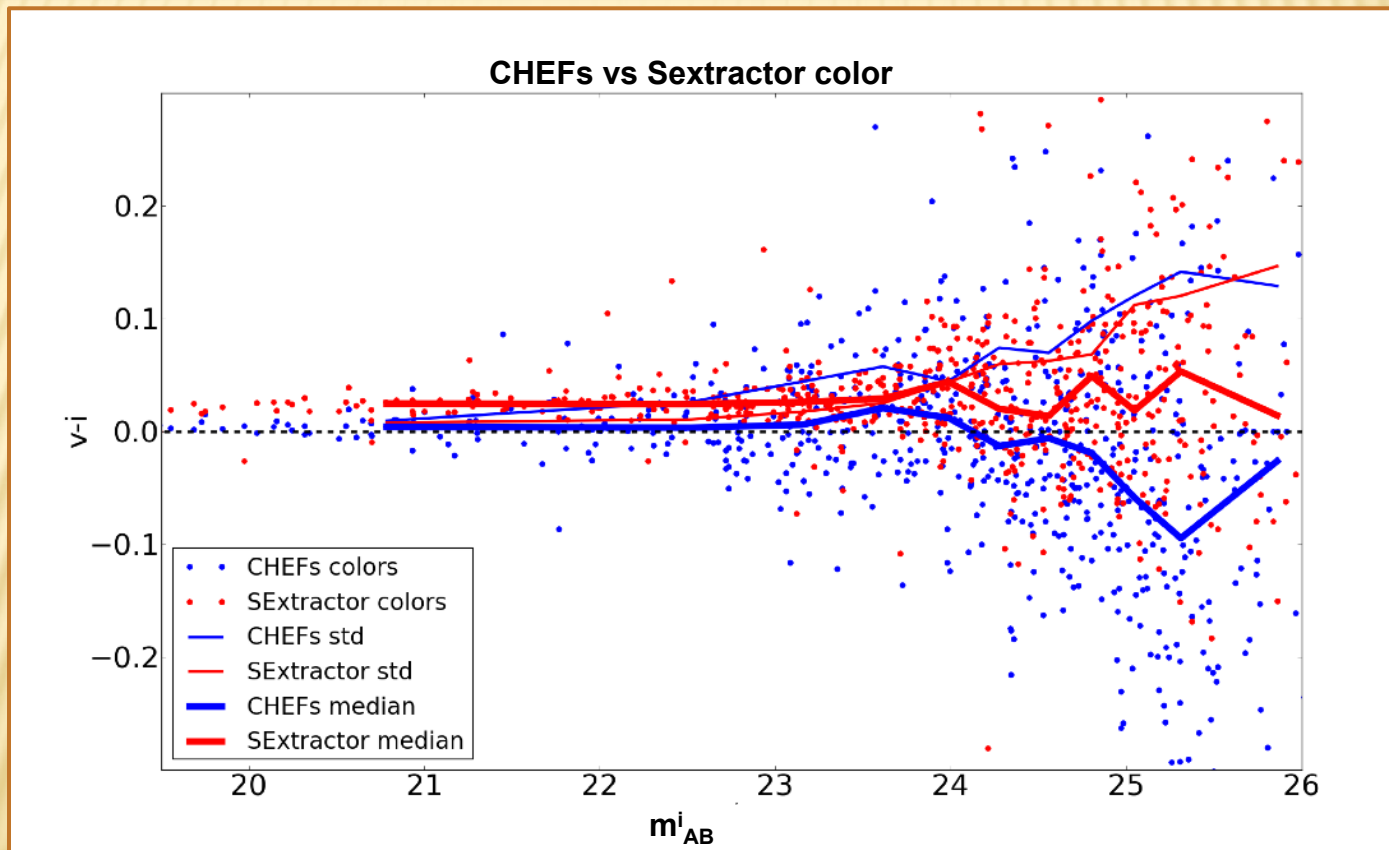


Maximum error of  $\approx 13.5\%$



Maximum error of  $\approx 1.6\%$

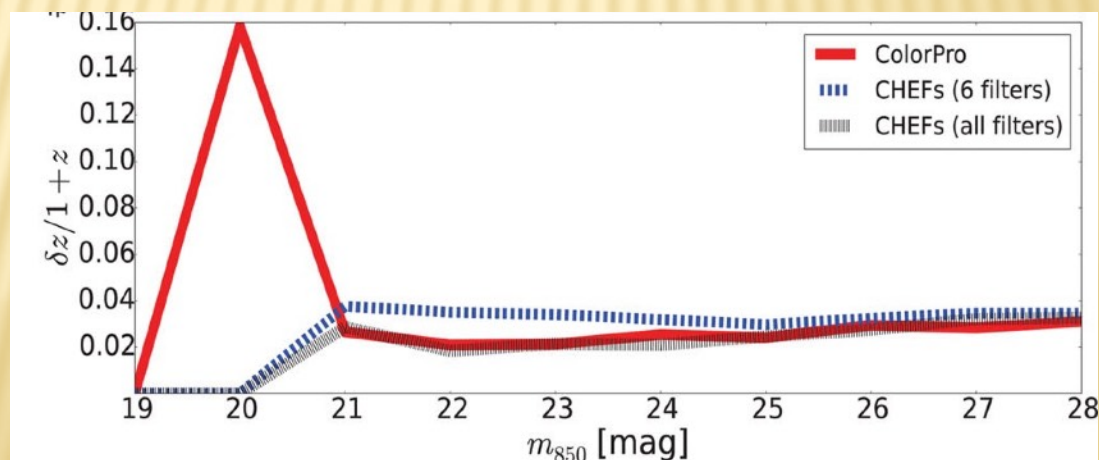
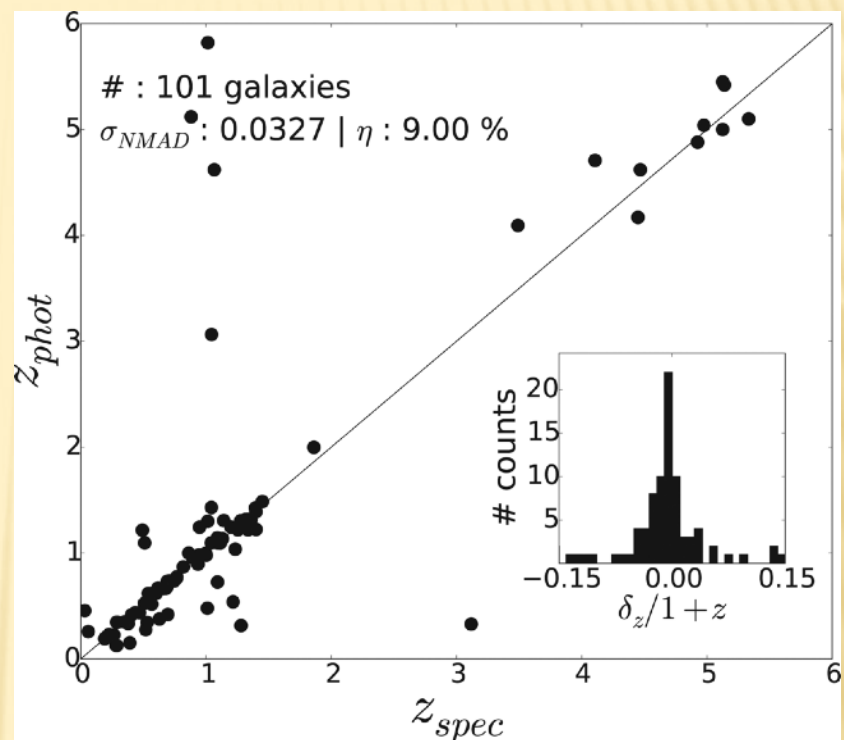
As the CHEFs provide us with total magnitudes, we could measure the colors in these images (which should be zero) **WITHOUT NEEDING THE PSF**. We compared the CHEF colors with the SExtractor ones, calculated by the usual method of degrading the images to the worst PSF and measuring in 3 arcsec apertures (Jiménez-Teja et al. 2015).





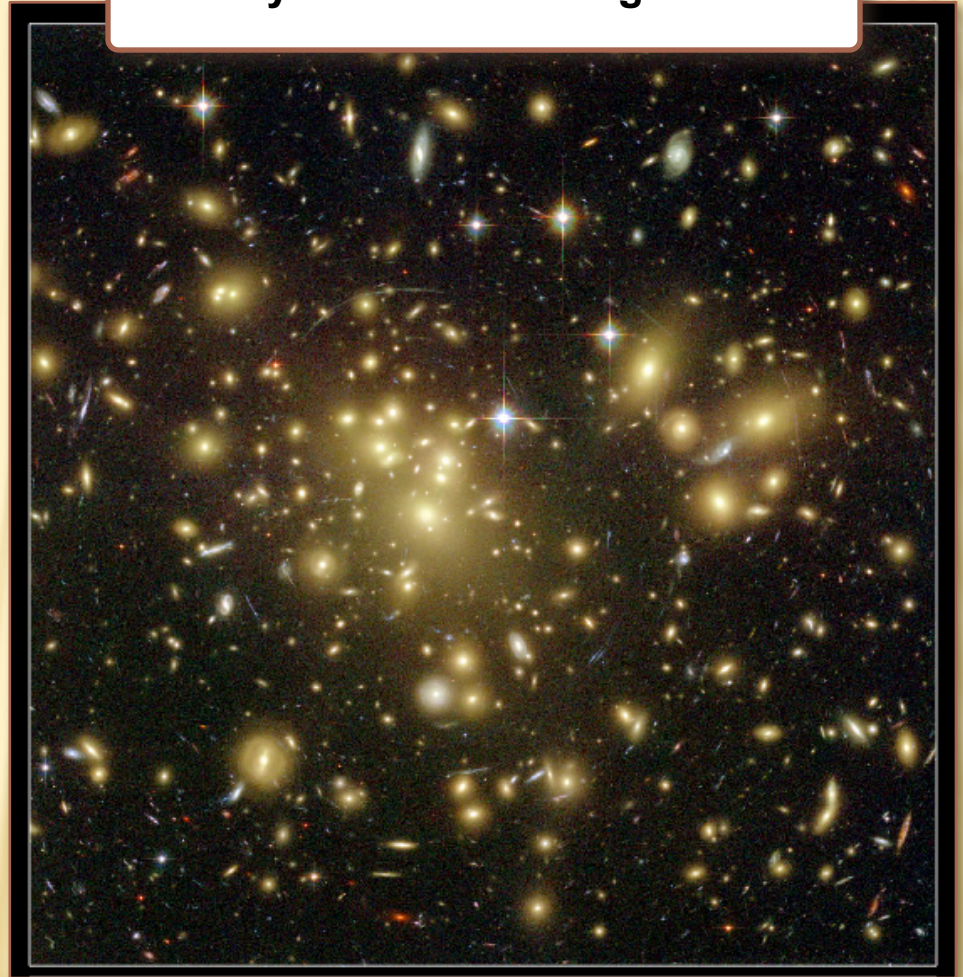
## XDF catalogue (Jiménez-Teja et al. 2015)

- 35732 sources (10823 with  $S/N \geq 5$ )
- Area: 10.8 arcmin<sup>2</sup>
- 4 near infrared and 5 optical bands, observed with WFC3 and ACS cameras in HST, respectively.
- Exposure time: 27 days.
- Typical depth: 30 AB mag in most filters.
- Photometric redshift average error: 2%
- No need for **PSF homogenisation** or **degradation of the images**.



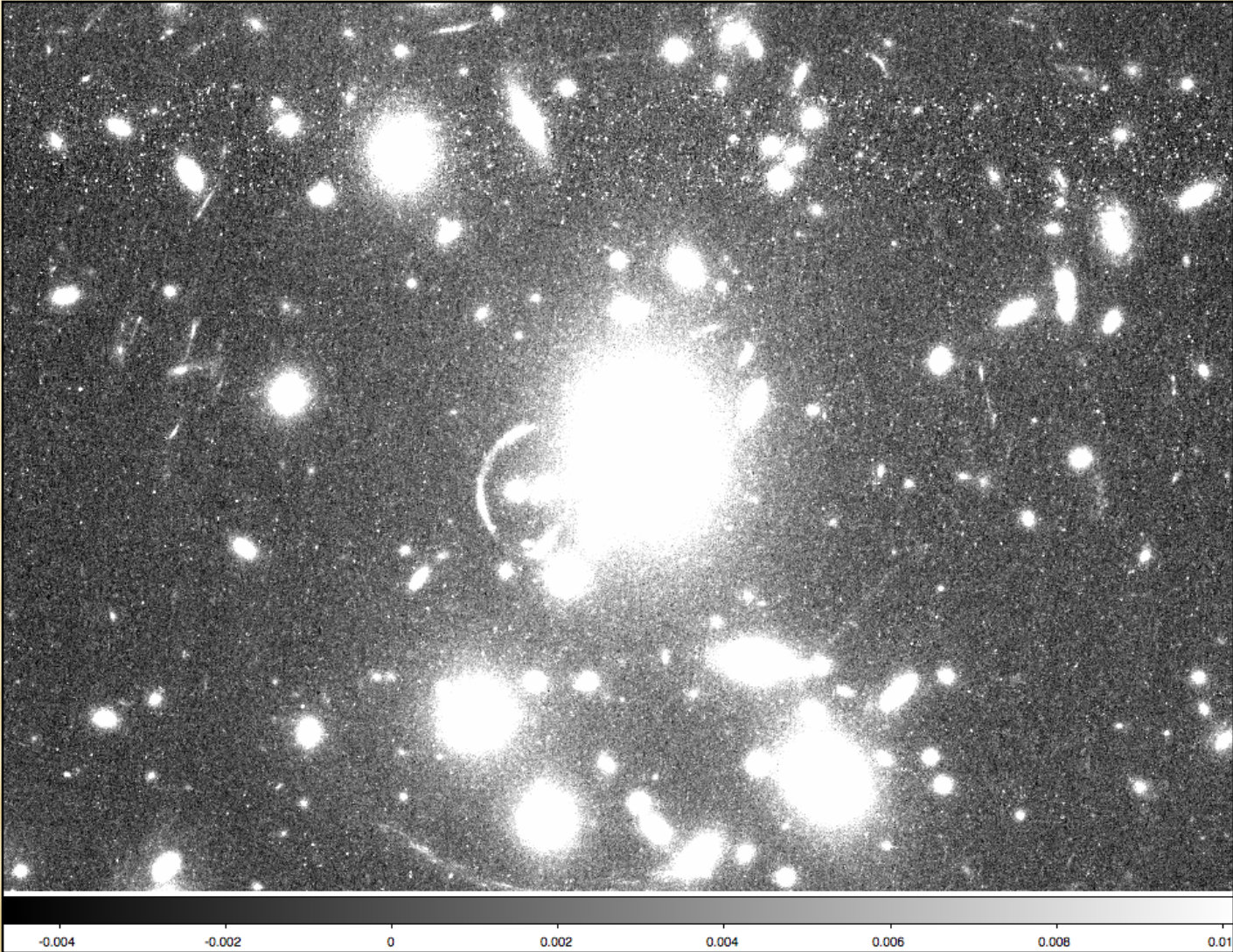
## Galaxy cluster modeling: CLASH

- CLASH (Cluster Lensing And Supernova Survey with Hubble) was one of the 3 multicycle treasury projects in 2010 (just two in Extragalactic Astronomy). It was devoted to dark matter studies and it had 550 Hubble orbits to observe 23 different galaxy clusters.



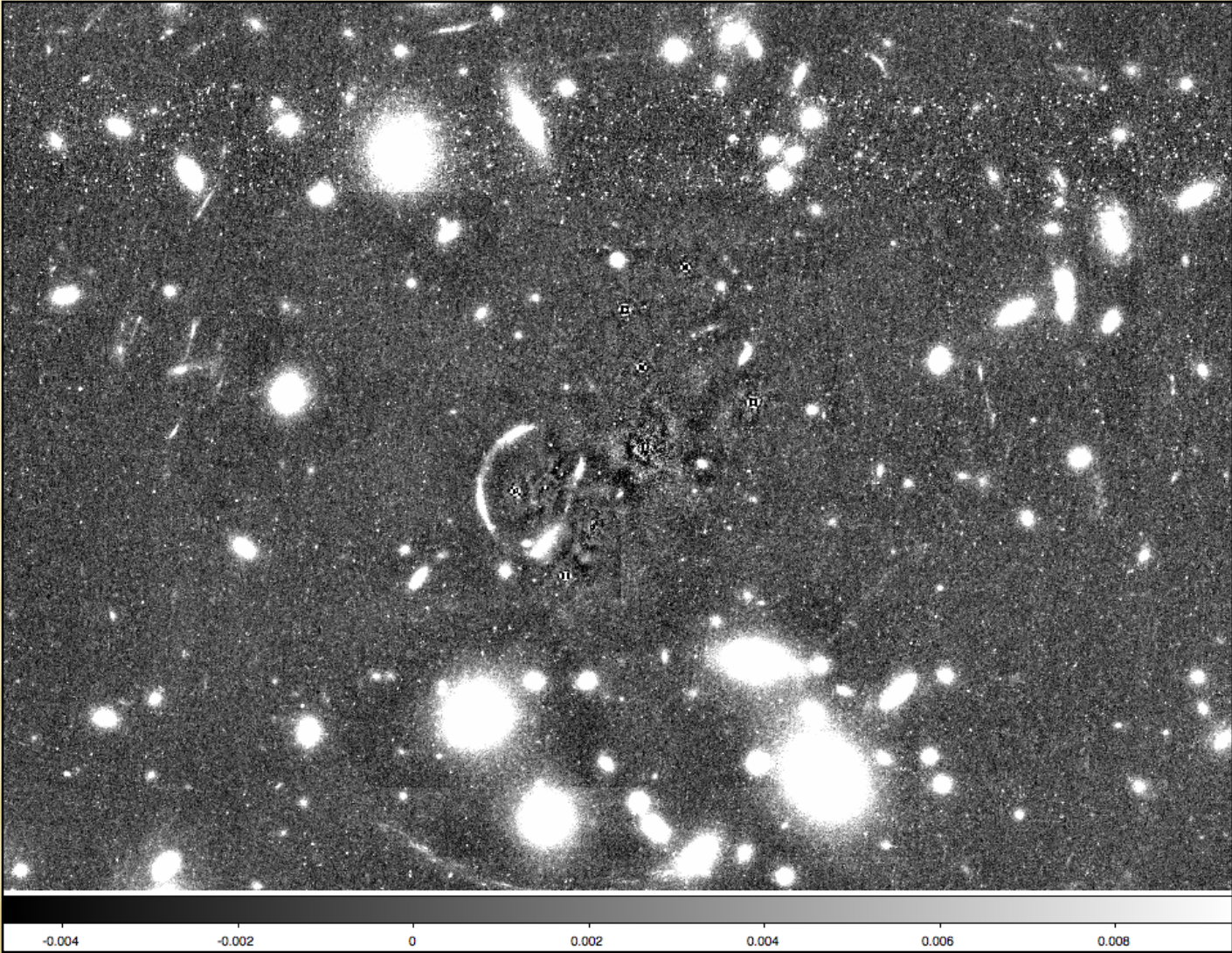


ABELL 1703  
(F850)  
(Zitrin et al, 2010)





ABELL 1703  
(F850)  
(Zitrin et al, 2010)

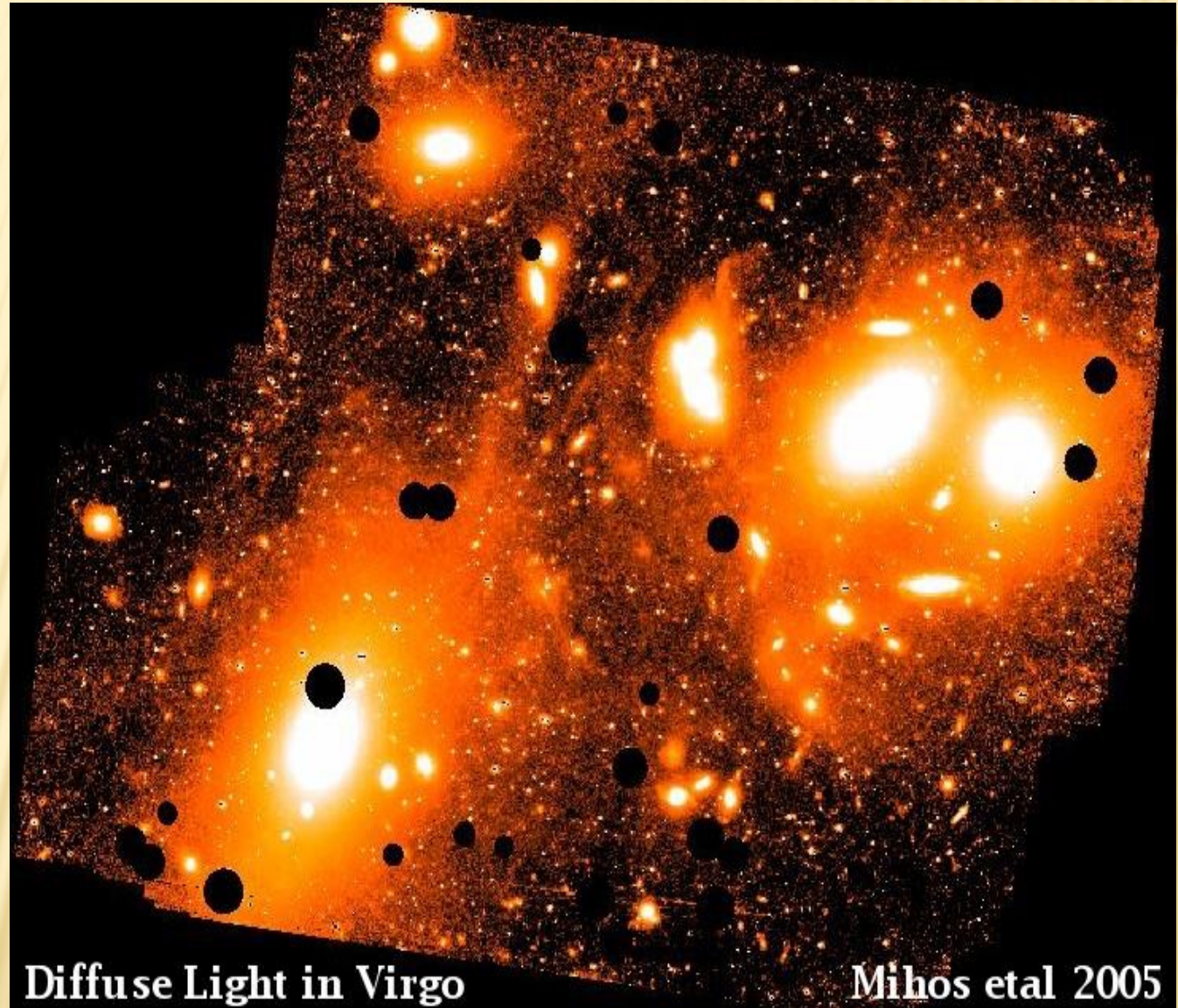




## ICL

The **intracluster light (ICL)** is defined as a luminous component consisting of stars that are gravitationally bound to the cluster potential but do not belong to any galaxy in the cluster.

ICL fraction = 10-50% of the optical light of the cluster (Zibetti et al. 2005, Rudnick et al. 2011, Contini et al. 2014).

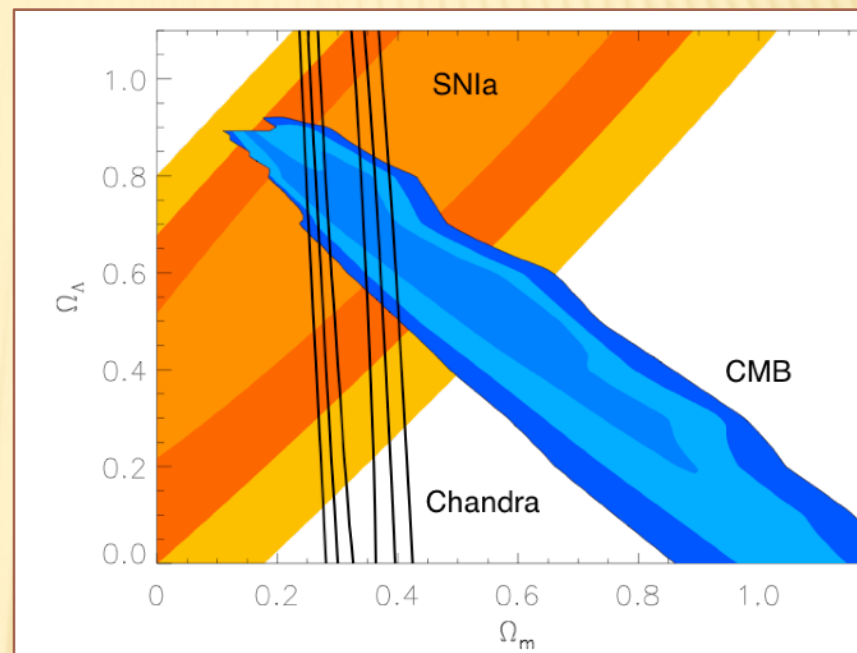


Diffuse Light in Virgo

Mihos et al 2005

## Why is ICL interesting?

- To understand the **hierarchical process of accretion of the clusters**.
- To understand the **metal enrichment** of the intracluster gas, still an open problem.
- To **constrain cosmological parameters** independently of the other methods, by measuring the baryon fraction in clusters (e.g. Allen et al. 2002, 2004; Lima et al. 2003; Lin & Mohr 2004).



(Allen et al. 2002)

## What do we know about the ICL fraction?

- **Real measurements:** existing techniques in the literature yield different results in the ICL fraction, up to a factor of 4, using the same data (Rudick et al. 2011; Cui et al. 2014).
- **Cluster mass:** correlated (Zibetti et al. 2005; Lin & Mohr 2004) vs constant or very weak dependence (Krick & Bernstein 2007; Murante et al. 2007; Contini et al. 2014)
- **Age:** non-linearly correlated (Krick et al. 2006; Rudick et al. 2011; Krick & Bernstein 2007; Contini et al. 2014).
- **Dynamical state:** correlated (Pierini et al. 2008; Adami et al. 2013).

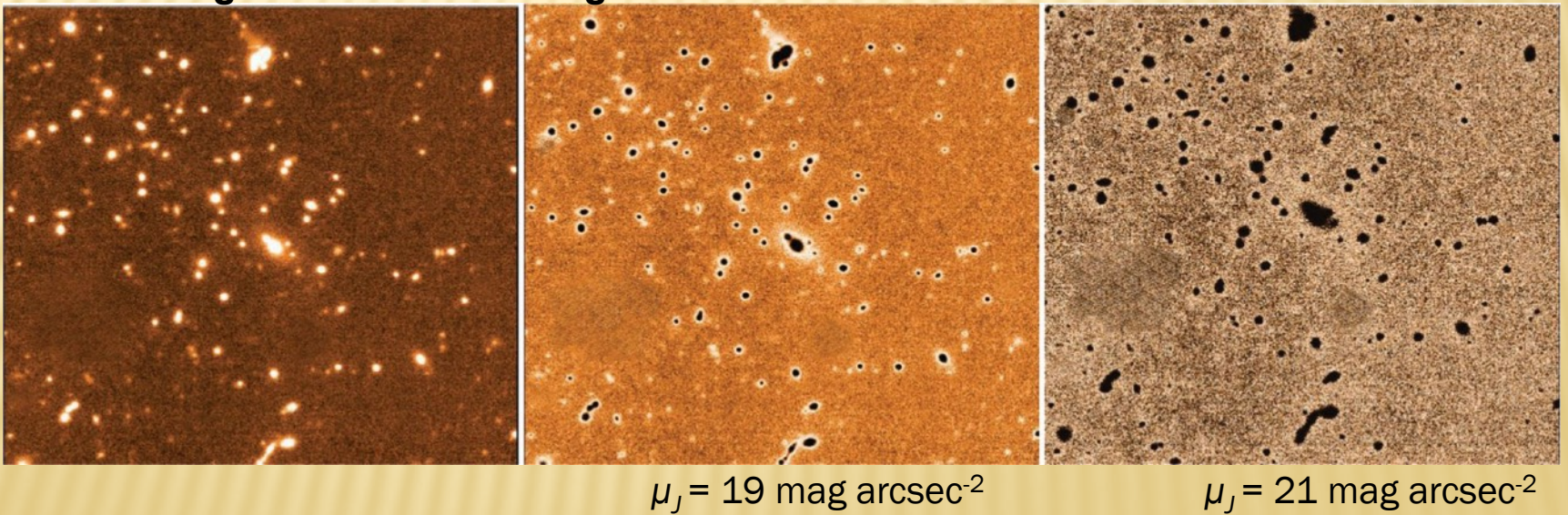


## Usual techniques (I)

### BCG+ICL modelling

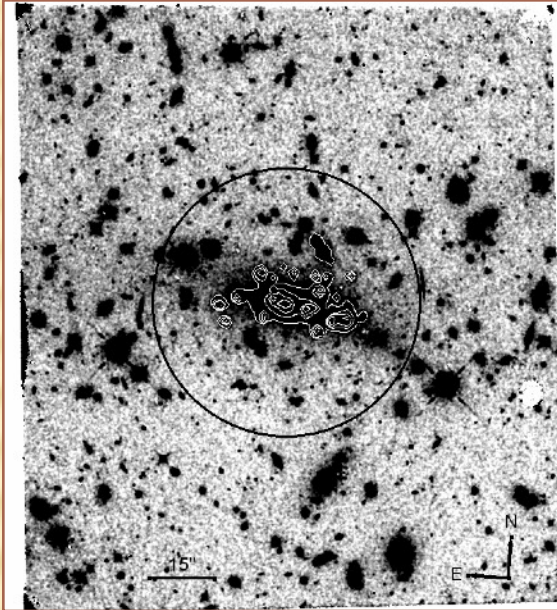


### Surface brightness thresholding

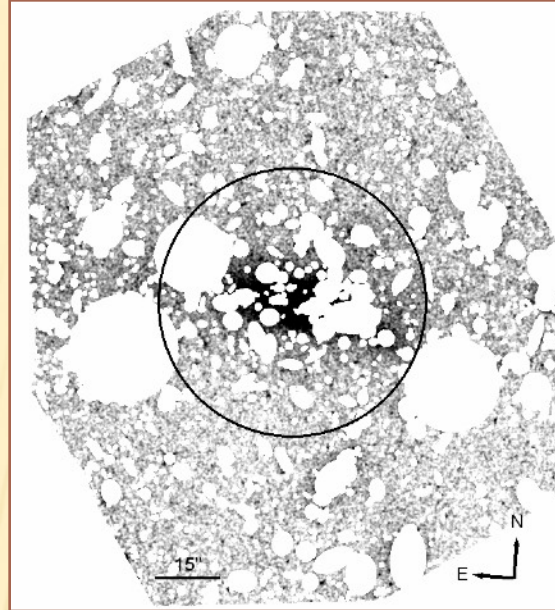




## Masking



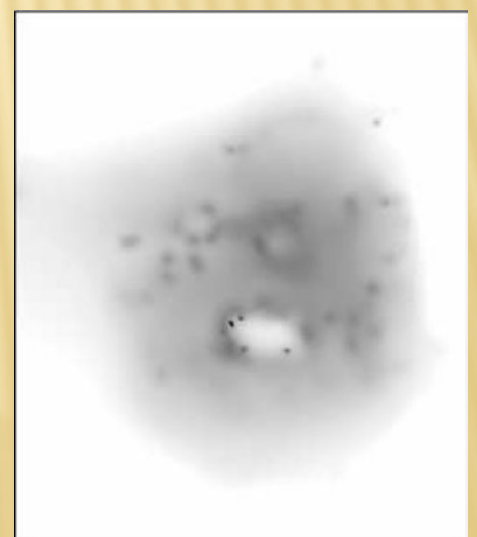
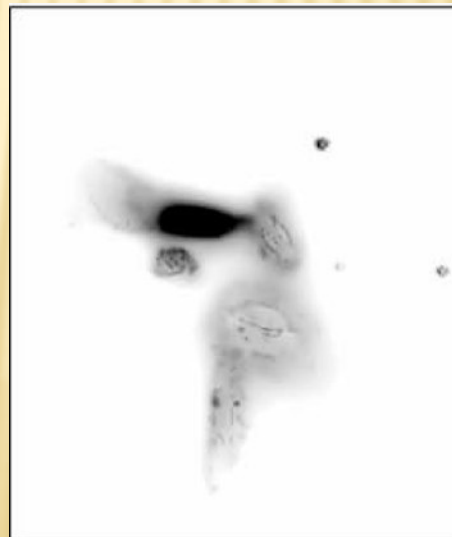
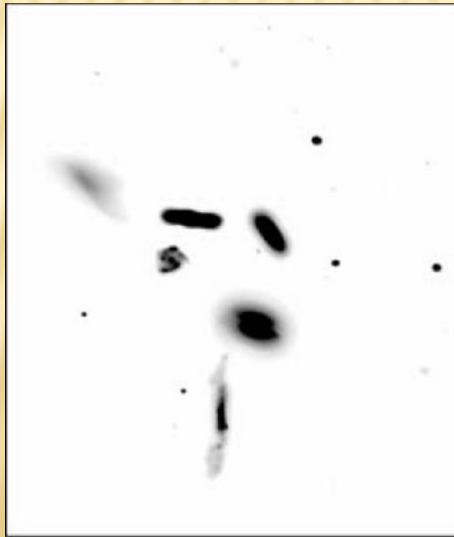
(DeMaio et al. 2015)



Usual techniques (II)

## Wavelets

(Da Rocha & Mendes de Oliveira 2005)



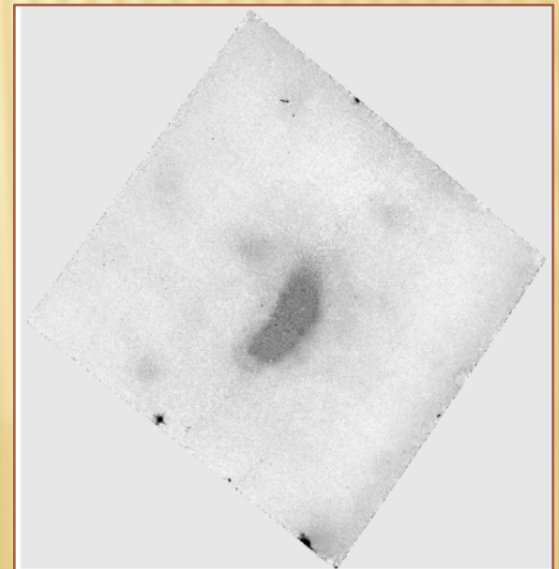
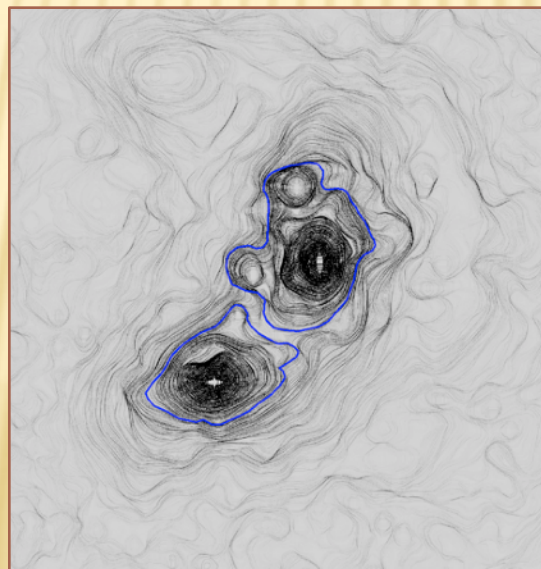
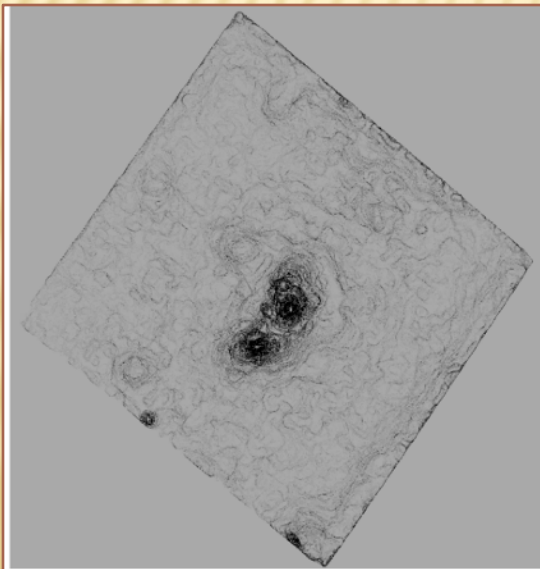
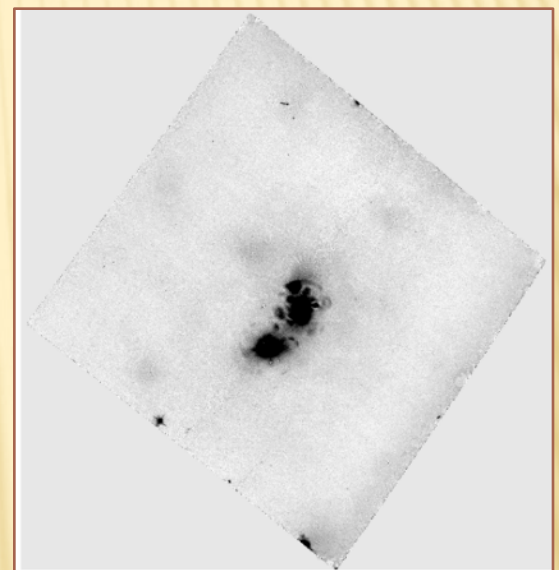
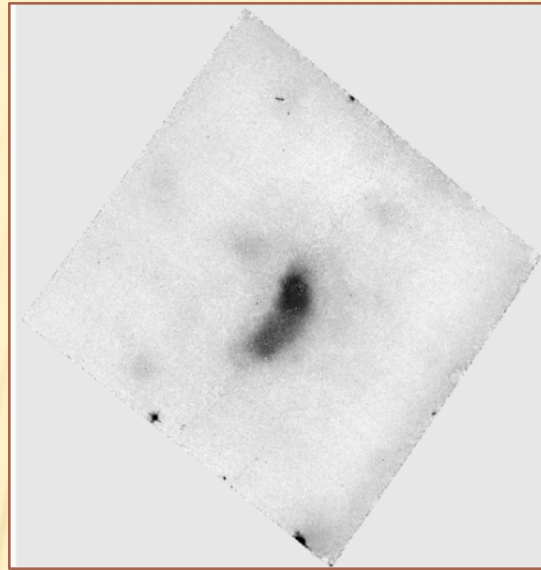
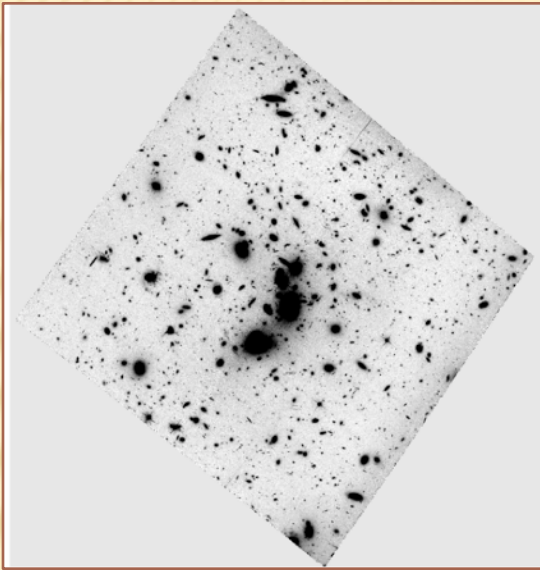


**Abell 2744  
(Pandora system)**

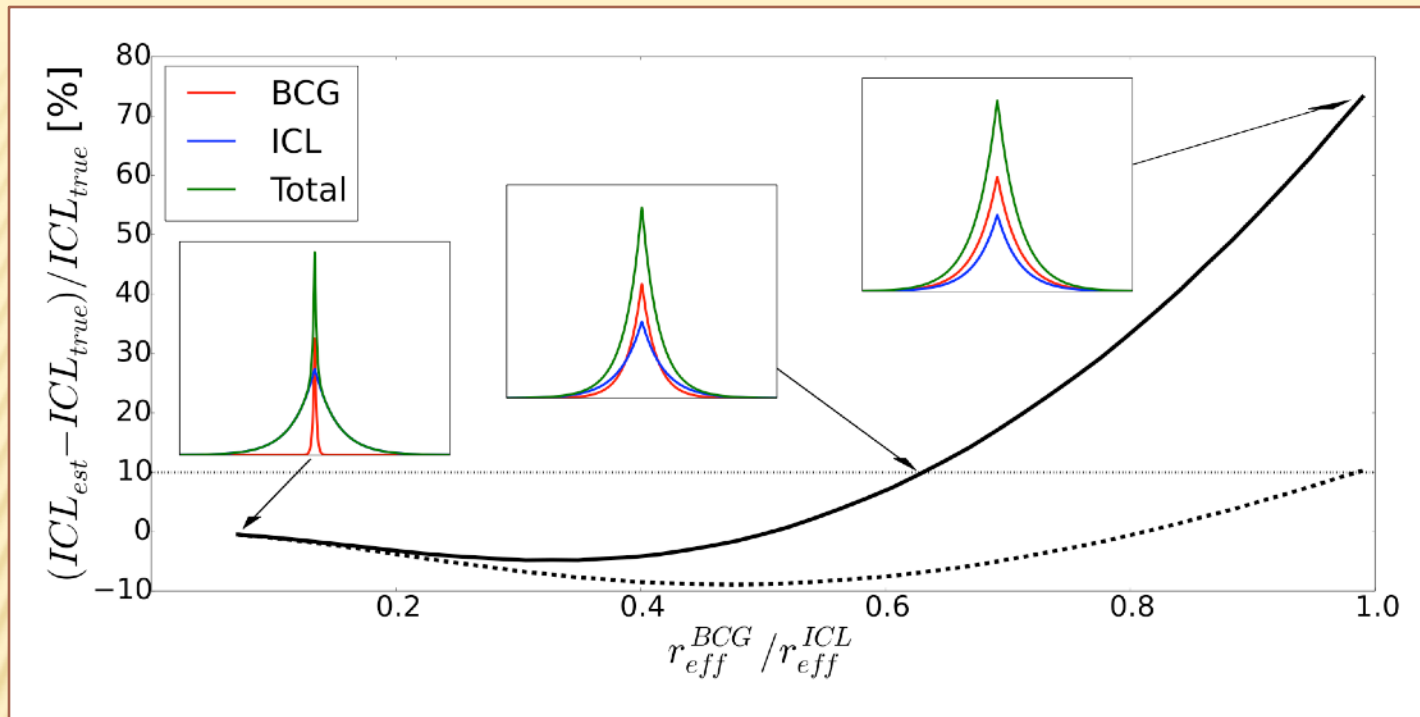




**Measurement of the ICL: CHEFs + Differential Geometry + Multiscale analysis  
(Jiménez-Teja & Dupke, 2016)**



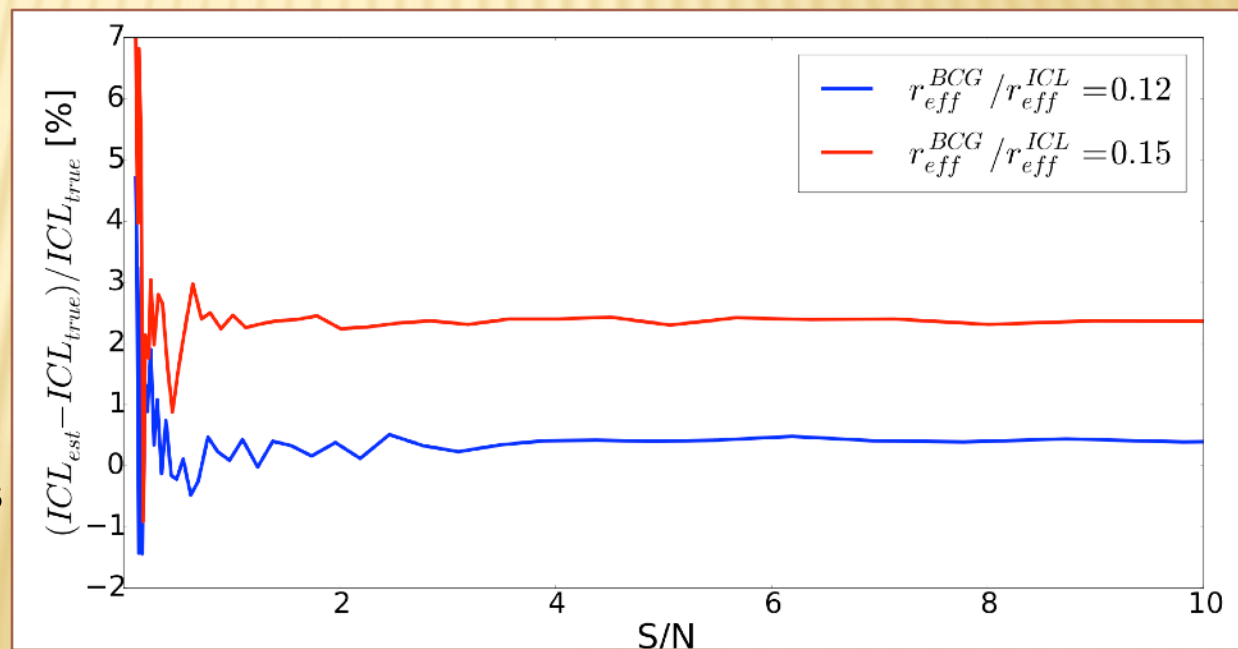




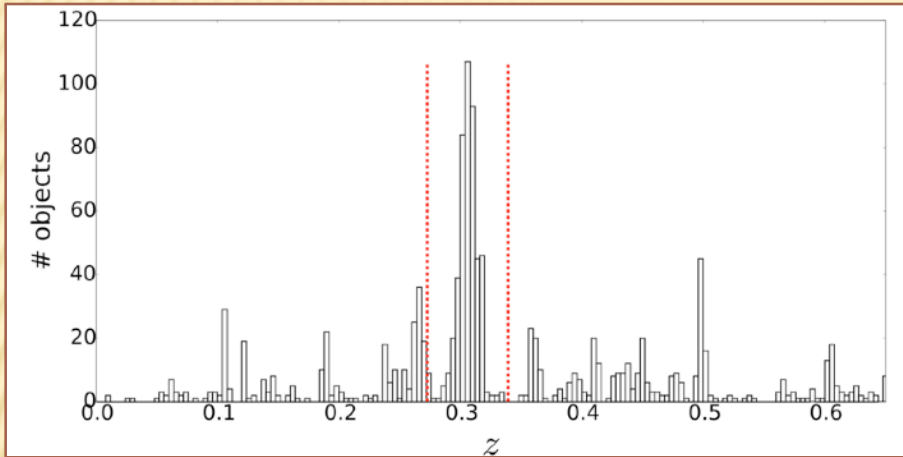
(Jiménez-Teja & Dupke, 2016)

“Average cluster” in range  $z \sim 0.2-0.3$  (Zibetti et al. 2005)

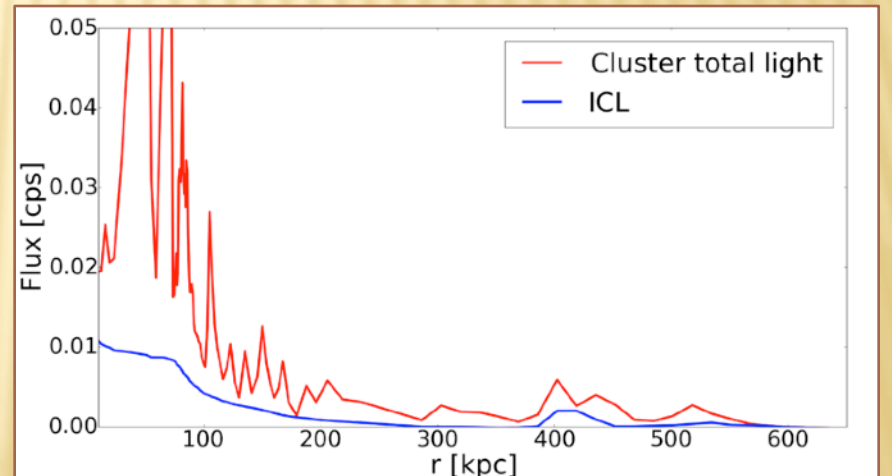
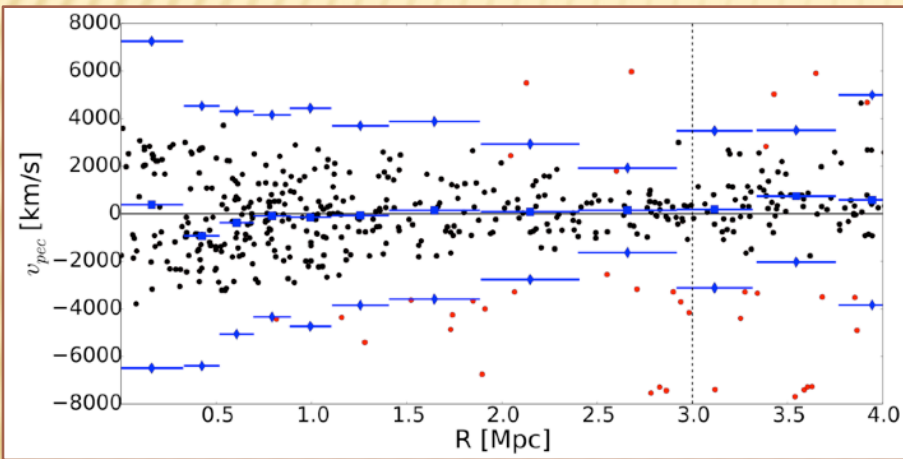
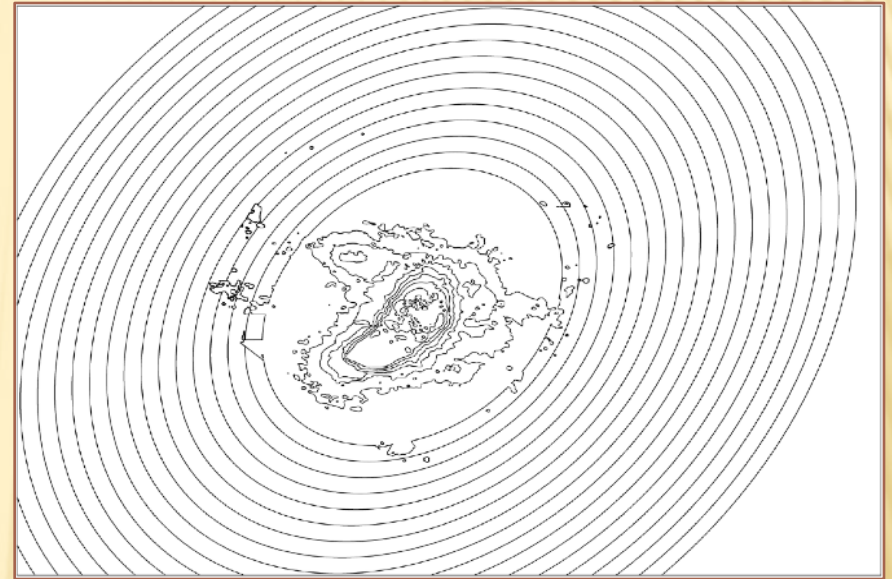
ICL surface brightness in  $[24.5, 37]$  mag/arcsec<sup>2</sup>



# Measurement of the ICL



(Jiménez-Teja & Dupke, 2016)



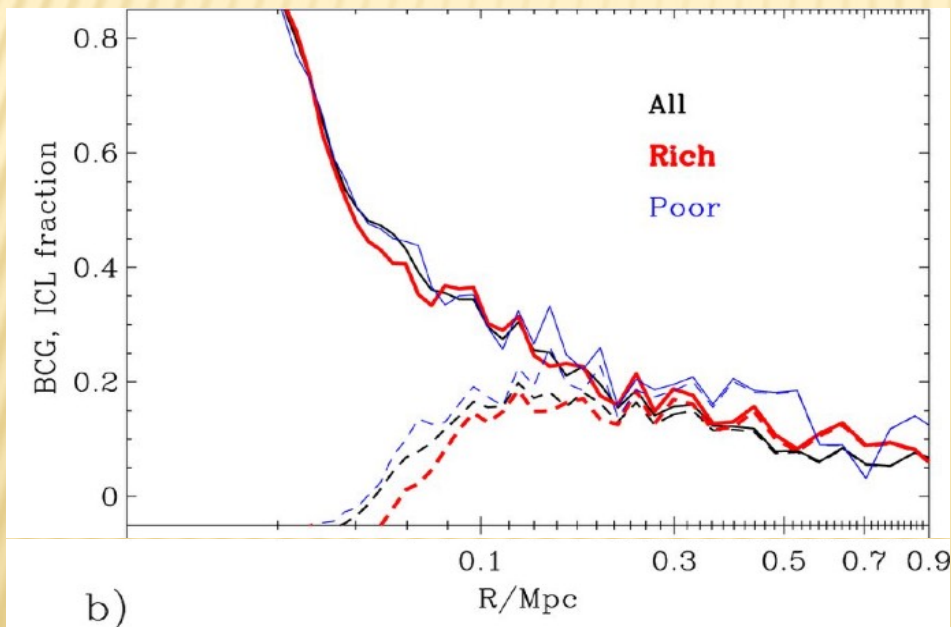
Cluster membership: PEAK+shifting gapper methods (Fadda et al. 1996, Owers et al. 2011)

ICL fraction =  $19.17 \pm 2.87\%$



## Results in the literature

- Numerical simulations predict an ICL fraction between 6%-24% for a cluster at redshift  $z \sim 0.3$  (Contini et al. 2014).
- Zibetti et al. (2005): analysis of 683 clusters from SDSS between  $z=0.2-0.3$ .
- Krick & Bernstein (2007):  $14 \pm 5\%$  (r band),  $11 \pm 5\%$  (B band), measured with ground-based images.



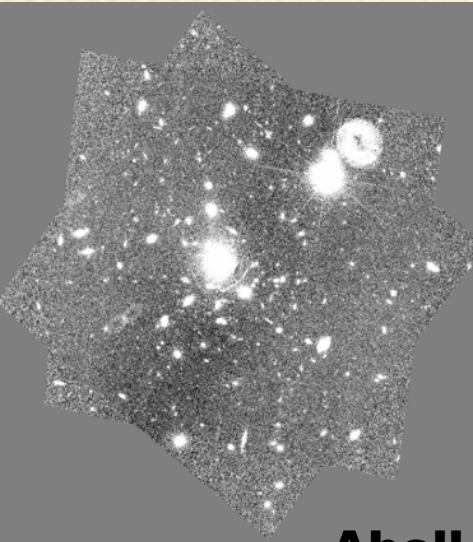
b)  
Zibetti et al. (2005)

Montes & Trujillo (2014):

- 4% (stellar mass density)
- 5.1% (surface brightness)
- 10.5% (radial distance)

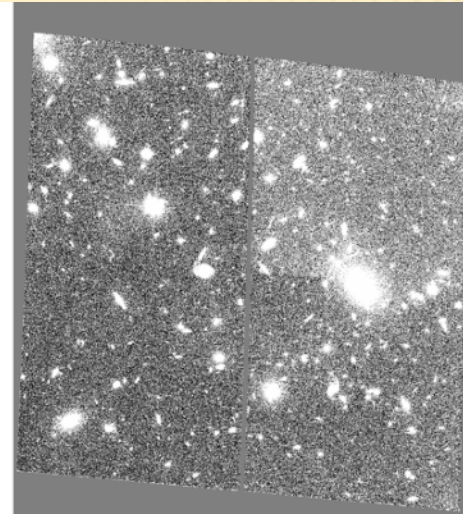
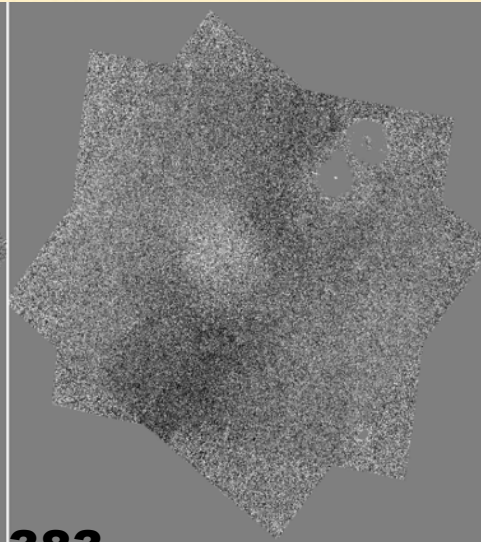
Using the same HST data of Abell 2744.

Work in progress: CLASH & FF clusters (Jiménez-Teja & Dupke, in prep)



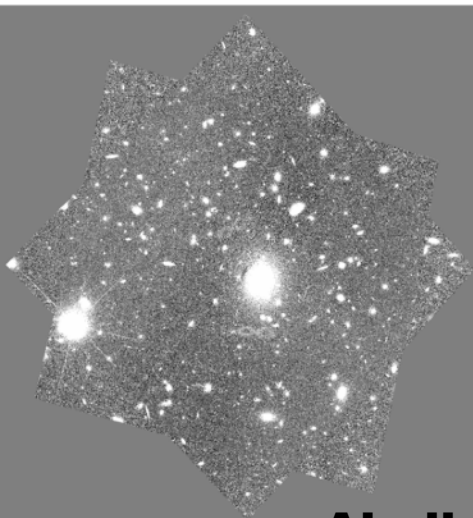
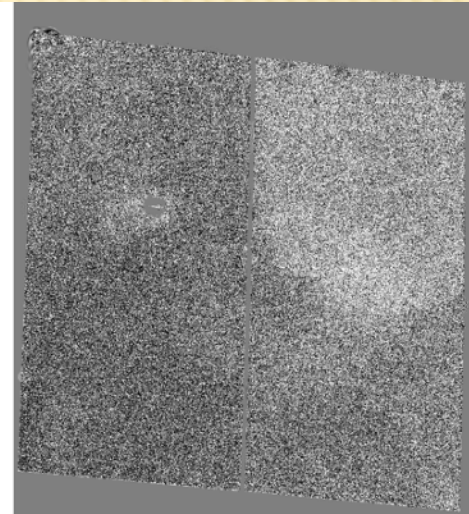
**Abell 383**

-0.015 -0.012 -0.0077 -0.0038 5.1e-05 0.0039 0.0078 0.012 0.015



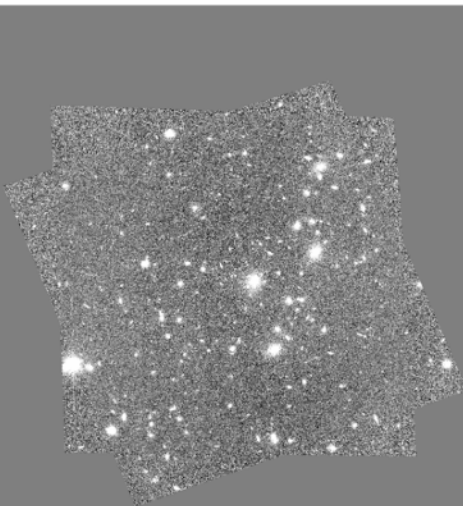
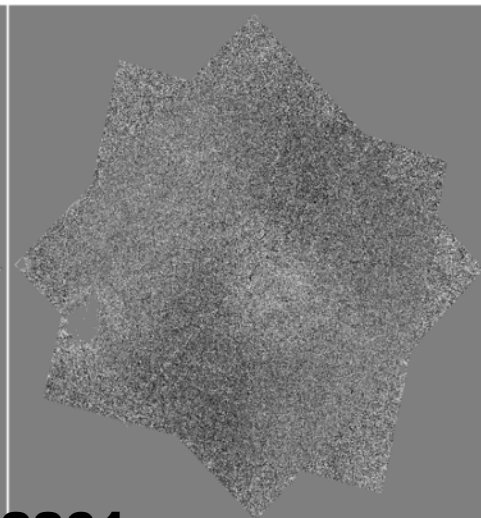
**Abell 611**

-0.0097 -0.0073 -0.0048 -0.0024 3.2e-05 0.0025 0.0049 0.0073 0.0097



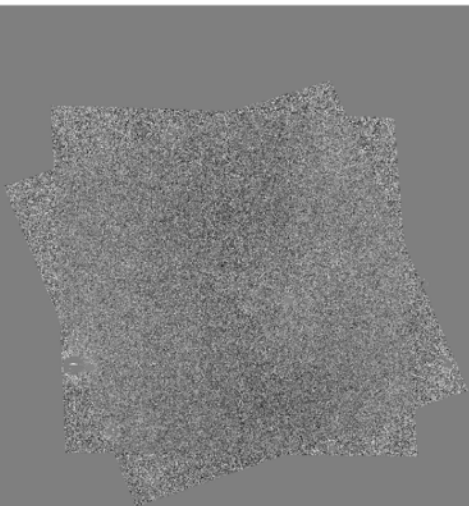
**Abell 2261**

-0.021 -0.015 -0.01 -0.0051 4.8e-05 0.0052 0.01 0.016 0.021

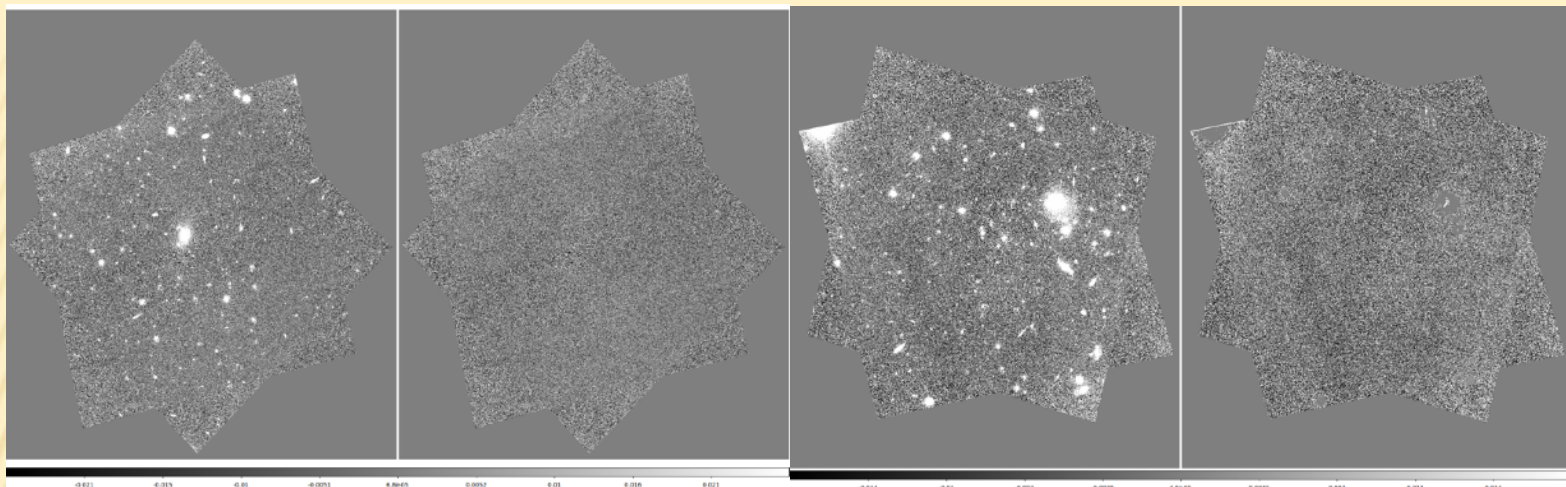


**MACS 0329**

-0.015 -0.012 -0.0077 -0.0038 5.1e-05 0.0039 0.0077 0.012 0.015

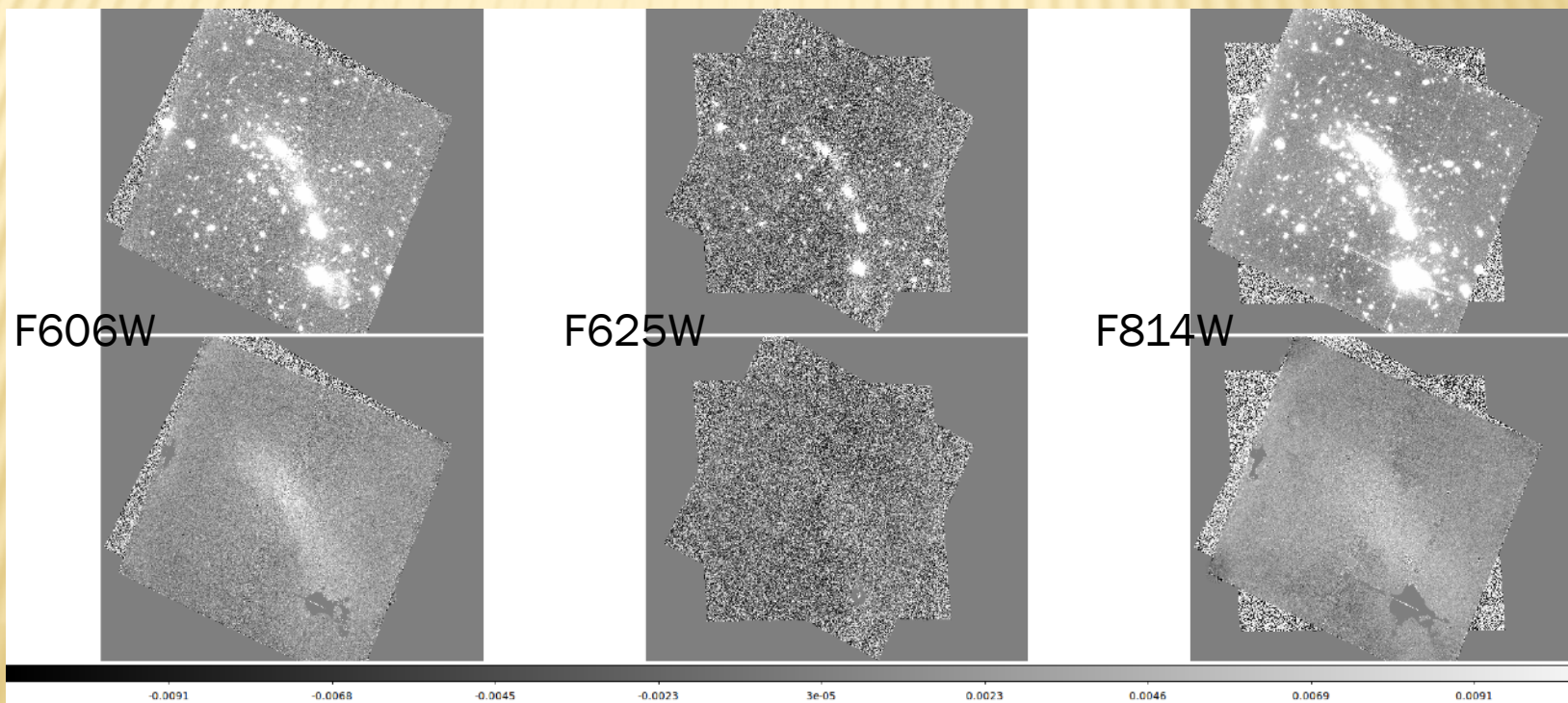






**MACS 0429**

**MACS 0744**



F606W

F625W

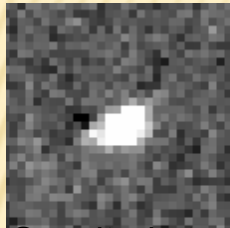
F814W

**MACS 0416**

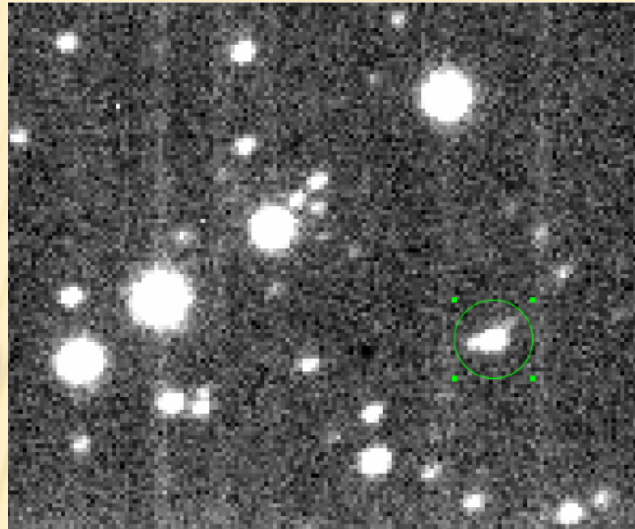
(Jiménez-Teja & Dupke, in prep)

### Before the occultation

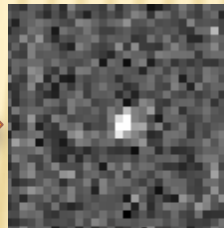
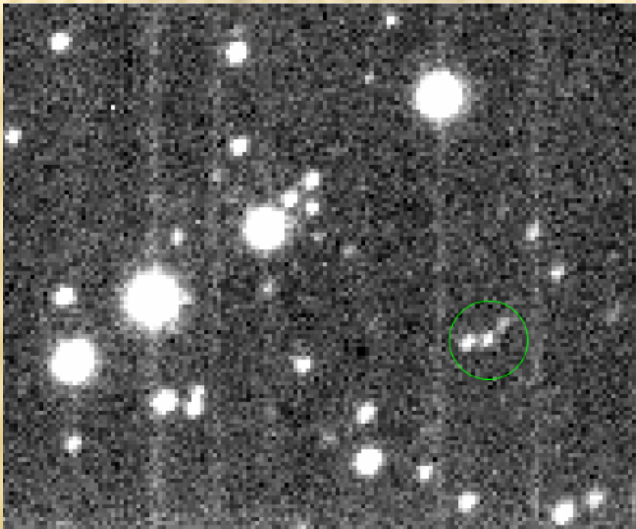
Not only useful  
for extragalactic  
people!!!



Occulted star



### During the occultation



TNO

(Alvarez-Candal et al., 2014)

To accurately determine the photo centers of the occulted star and the TNO (2002 KX<sub>14</sub>), we need to remove the light contamination of nearby stars and the TNO before the occultation.

The strategy consisted on modeling the three objects **during the occultation** and removing them from the stacked image obtained **before the event**, previously shifting the CHEF models because of the alignment of the images and the TNO non-sidereal motion.



**THANK YOU!**