

# 10 Gyrs of galaxy evolution with LSST

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on behalf of a larger team including

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Crescenzo Tortora (Kapteyn Institute)

Fedor Getman (INAF - OAC)

Massimo Dall'Ora (INAF - OAC)

Giuseppe Longo (University of Naples)

Mario Radovich (INAF -OAPD)

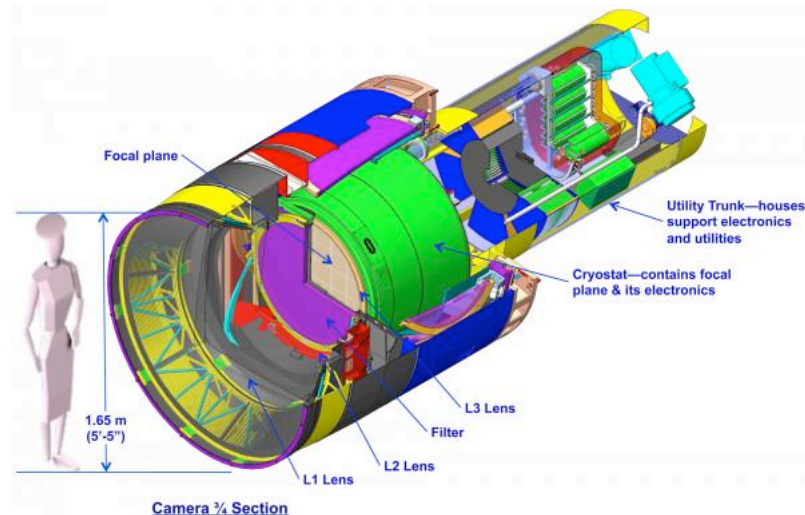
Valeria Amaro (University of Naples)

Civita Vellucci (University of Naples)



## LSST Camera

- large-aperture, wide-field optical imager
- near ultraviolet to near infrared (0.3-1  $\mu\text{m}$ )
- 3.5-degree field of view;  **$\sim 9.6 \text{ deg}^2$**
- 10  $\mu\text{m}$  pixels and **0.2"/pixel** sampling
- optimized pixel sensitivity vs pixel resolution
- mosaic of 189 16-megapixel silicon detectors
- 21 "rafts" to provide a total of about **3.2 gigapixels**
- Median delivered image quality  $\sim 0.7''$  FWHM



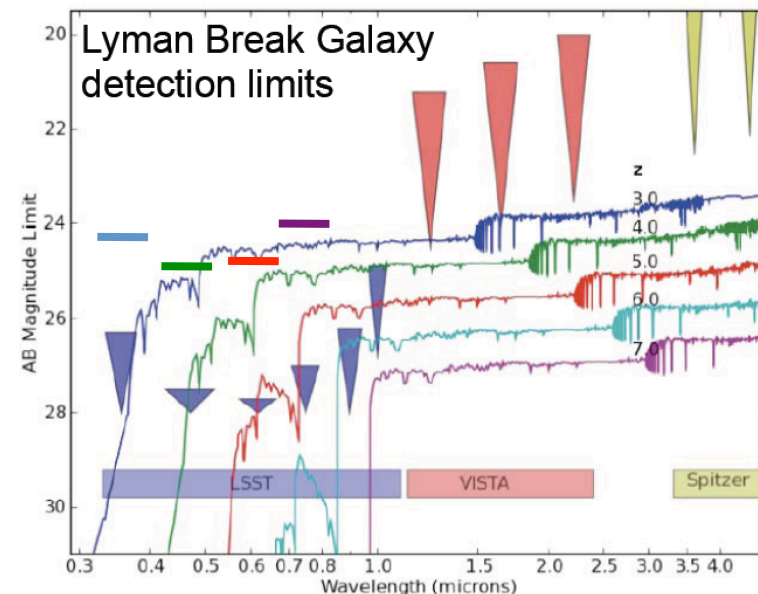
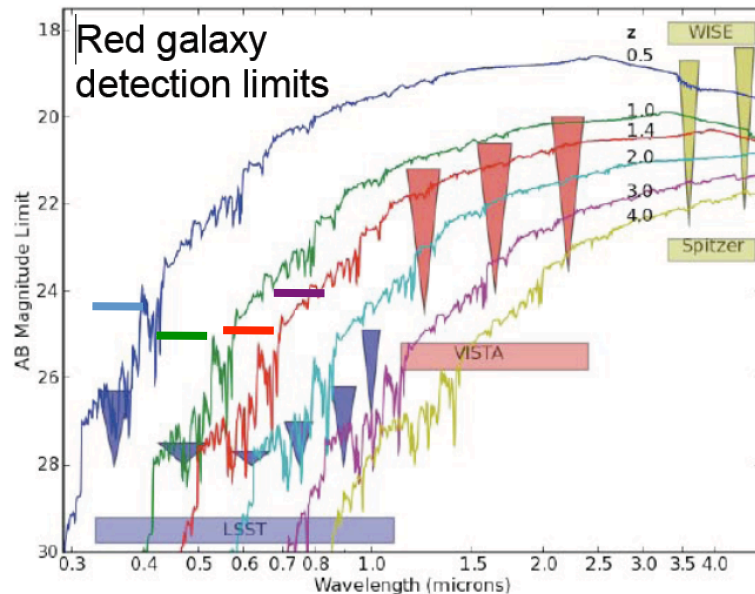
## LSST Deep Sky

Area: 18,000 deg<sup>2</sup>

Single epoch: 5 $\sigma$  pt. source detection limits  $u \sim 23.9$ ,  $g \sim 25.0$ ,  $r \sim 24.7$ ,  $i \sim 24.0$ ,  $z \sim 23.3$ ,  $y \sim 22.1$  AB

After 10 years: 5 $\sigma$  pt. source detection limits  $u \sim 26.3$ ,  $g \sim 27.5$ ,  $r \sim 27.7$ ,  $i \sim 27.0$ ,  $z \sim 26.2$ ,  $y \sim 24.9$  AB

- a total of  $>10^{10}$  galaxies detected up to  $z \sim 6$  – and  $\sim 10^{10}$  stars
- $>10^9$  galaxies detected at  $z > 2$
- $>10^7$  galaxies detected at  $z > 4.5$
- structural measurements and *ugrizy* photometry for  $4 \times 10^9$  galaxies at  $z < 1.5$



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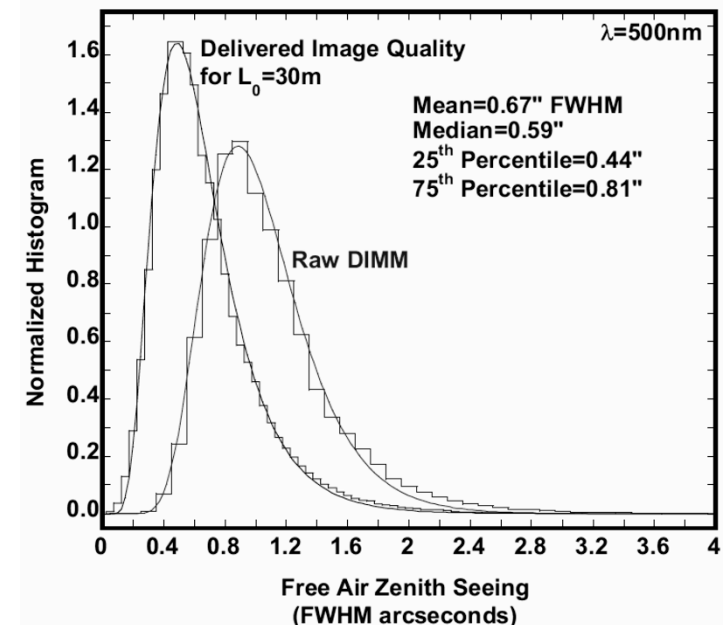
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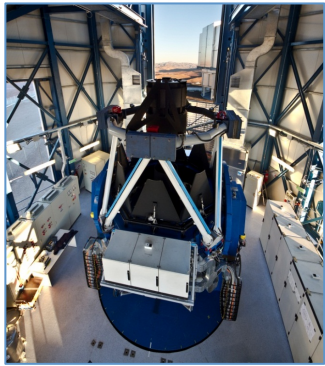
- median seeing is 0.65"  $\rightarrow$  4 kpc at  $z = 0.5 \sim$  typical  $L_*$  size.
- parametric models will be able to discriminate between bulge- or disk-dominated galaxies up to  $z \sim 0.6$ ,
- the 25<sup>th</sup> percentile has FWHM=0.44"  $\rightarrow \sim 3.7$  kpc at  $z \sim 1.5$ !! yet around the typical  $L_*$  sizes.
- $\sim 4$  Billions of  $L_*$  galaxies at  $z = 1.5$

**9.4 Gyr lookback time**





# VST People and Institutes

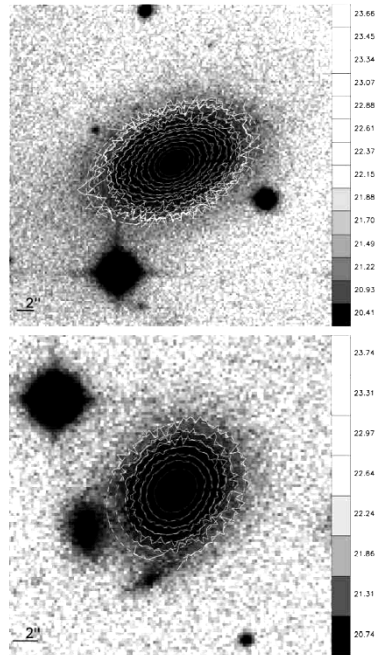


## PSF convolved Sersic fit

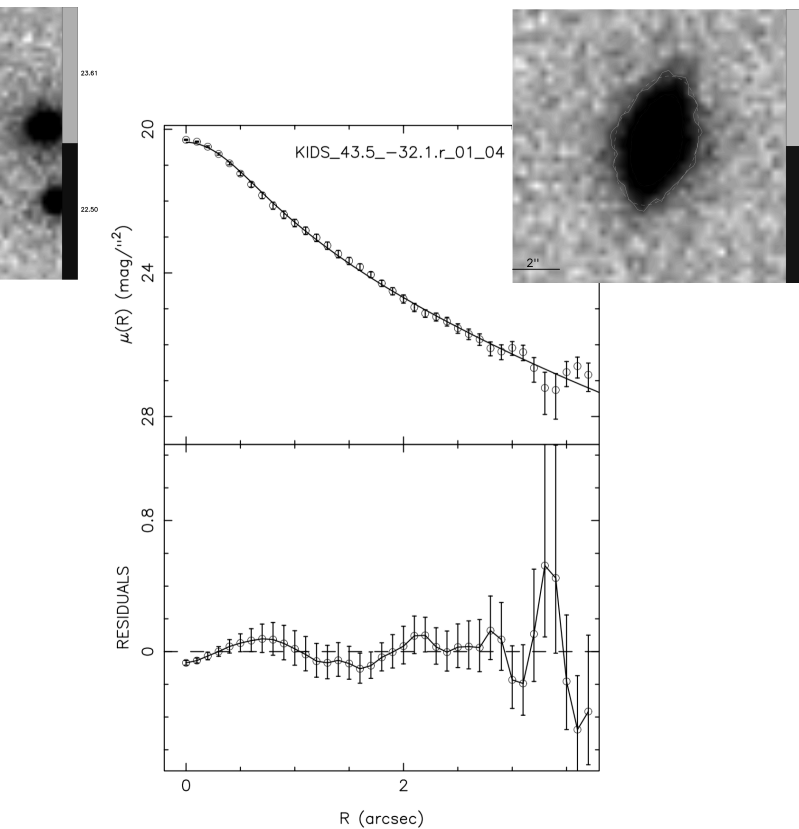
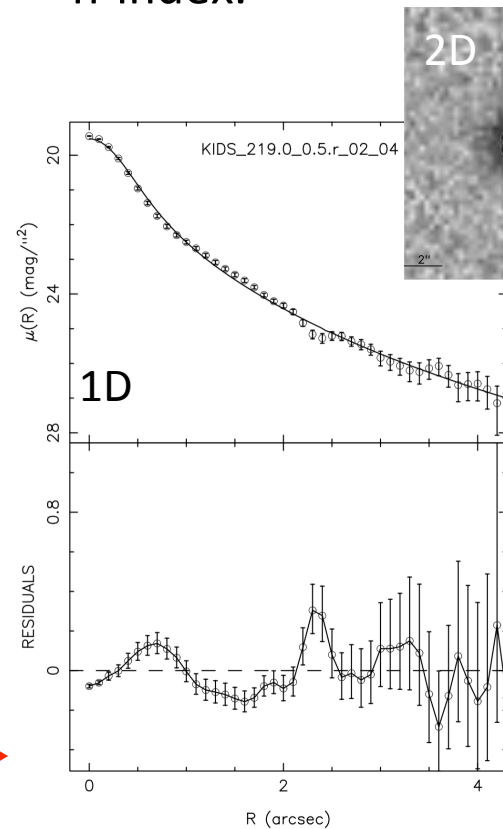
**2DPHOT main parameters** (Roy et al., 2016, in preparation)

$R_e$ ,  $\langle \mu \rangle_e$ , magnitudes, Sersic index  $n$ ,  $b/a$ , PA,  $a_4$

with typical expected accuracy of  $\sim 20\%$  in  $R_e$ , and the Sersic  $n$ -index.



SB performed over a scale of sub-arcsec to few arcsecs

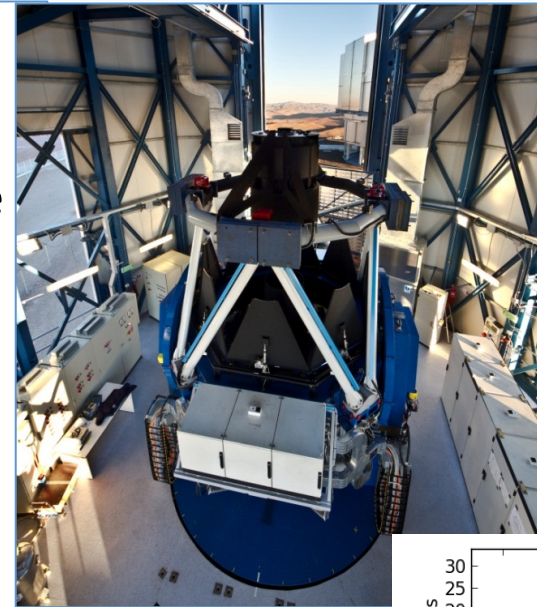




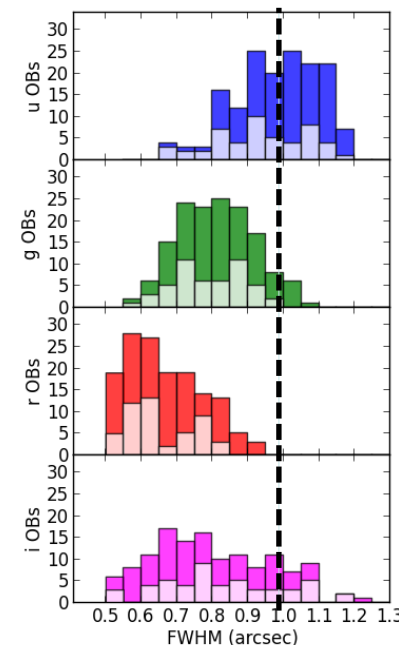
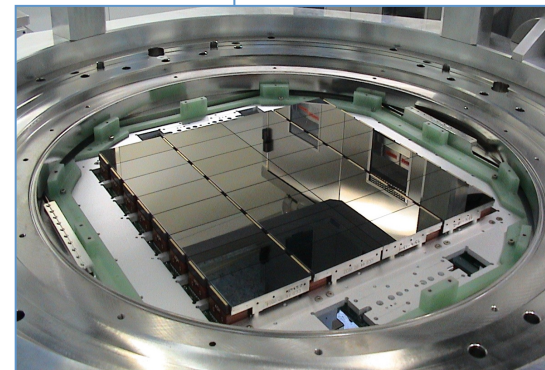
# VST as LSST precursor



- Primary mirror: 2.6m
- Secondary mirror: 0.9m
- Field corrector with 3 lenses (2 in the telescope + 1 in the camera)
- **Field: 1° x 1°**
- Shack-Hartmann wavefront sensor
- **Active M1 shape control**
- **Active M2 positioning in 5 dof (hexapod)**
- Autoguiding with probe in polar coordinates
- ADC with counter-rotating doublet of prisms, exchangeable with 2 Lens corrector
- **0.27 Gpixel 1°x1° f.o.v.**
- **0.21 arcsec/pixel**
- 32 scientific CCDs + 4 outer CCDs
- Image analysis curvature sensor



**median seeing 0.7"**





# VST SKY

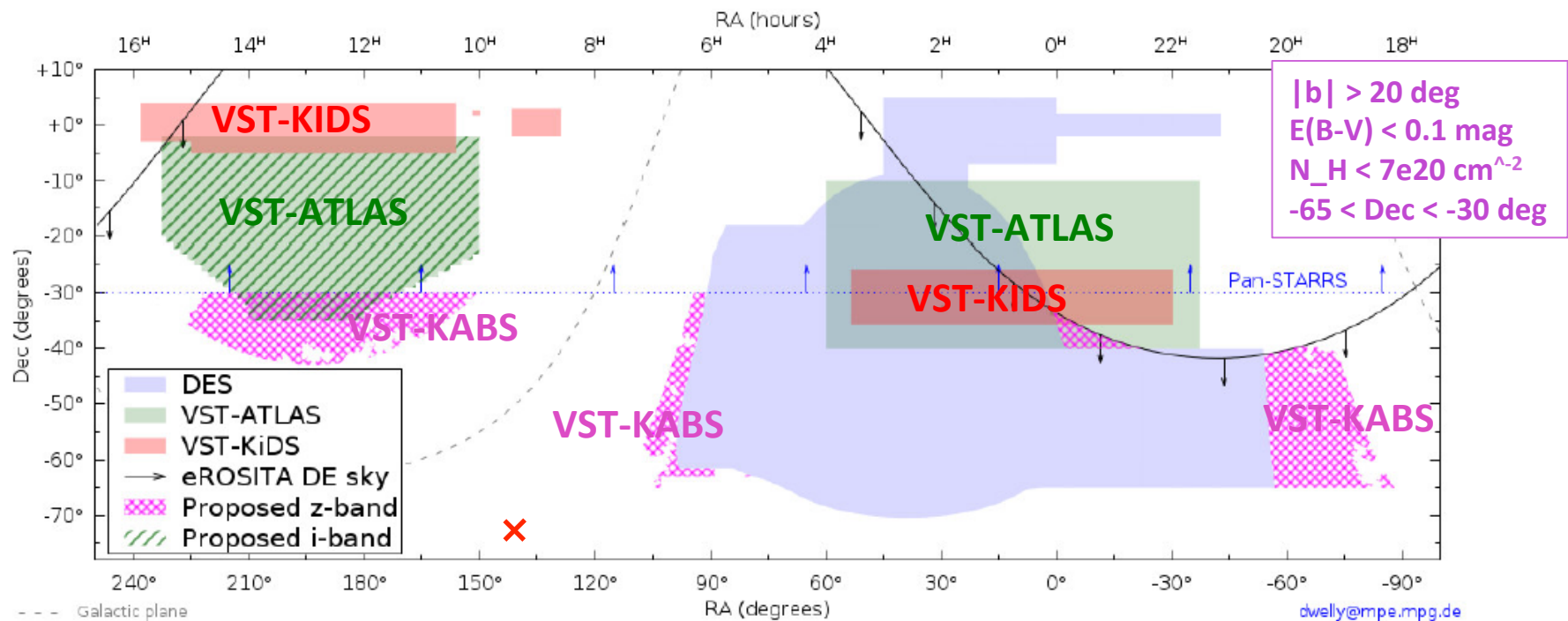


~6500 deg<sup>2</sup> by 2021

ATLAS: 4500 deg<sup>2</sup> in ugriz (depth 23.5 in r-band – 5sigma 2" ap)

KiDS: 1500 deg<sup>2</sup> in ugr (depth 25.5 in r-band – 5sigma 2" ap)

KABS: 1000 deg<sup>2</sup> in gri(uY) (depth 24.5 in r-band – 5sigma 2" ap)





# Analysis tools



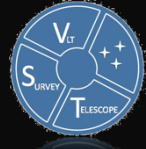
## Galfit vs 2DPHOT

	Galfit	2DPHOT
PRO	Fast; Popular	PSF modeling; isophotal analysis (a4, b4); pixel integration convolution -> optimized for subarcsec objects
CONS	Initial Condition Set-up	slower (~min/gal)



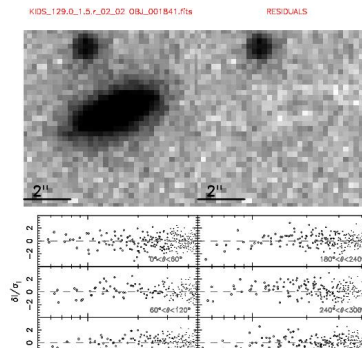
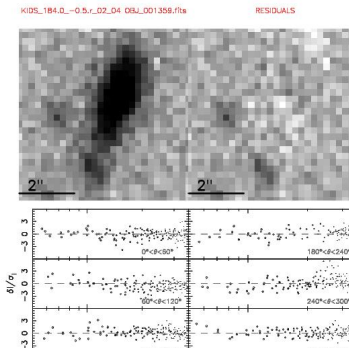
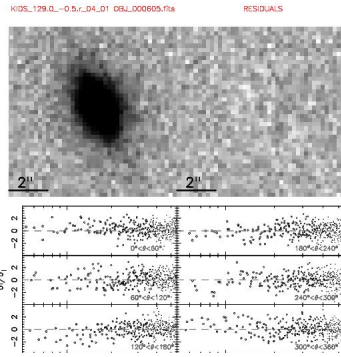


# Analysis tools

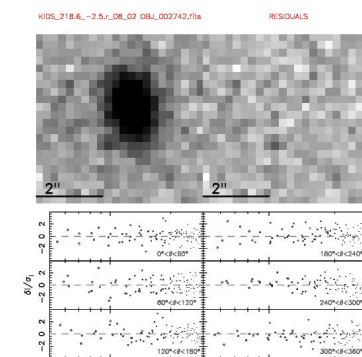
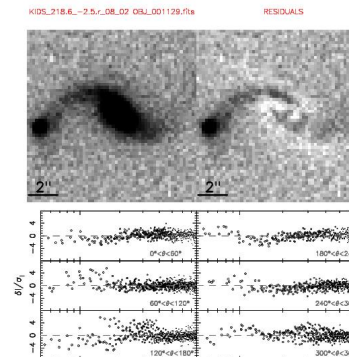
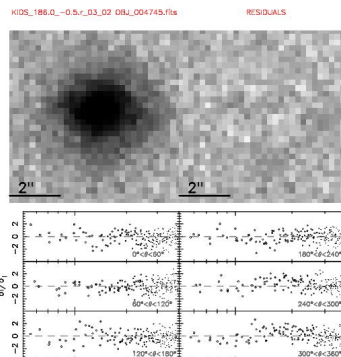


## Sample of high $z$ galaxies

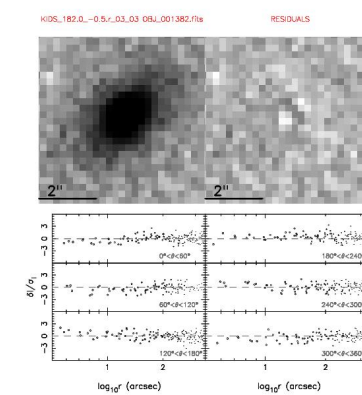
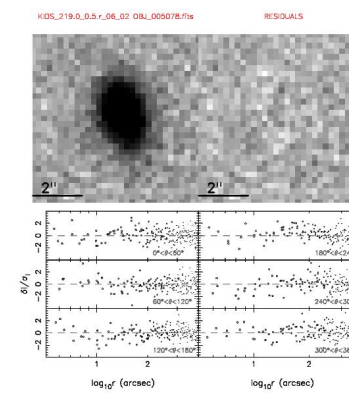
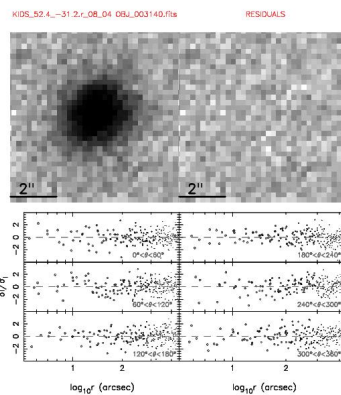
$z=0.3$



$z=0.4$

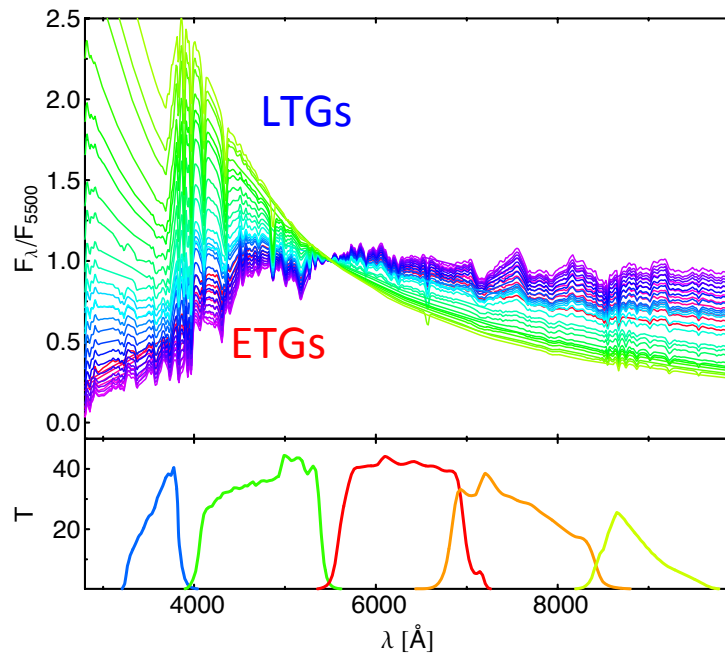
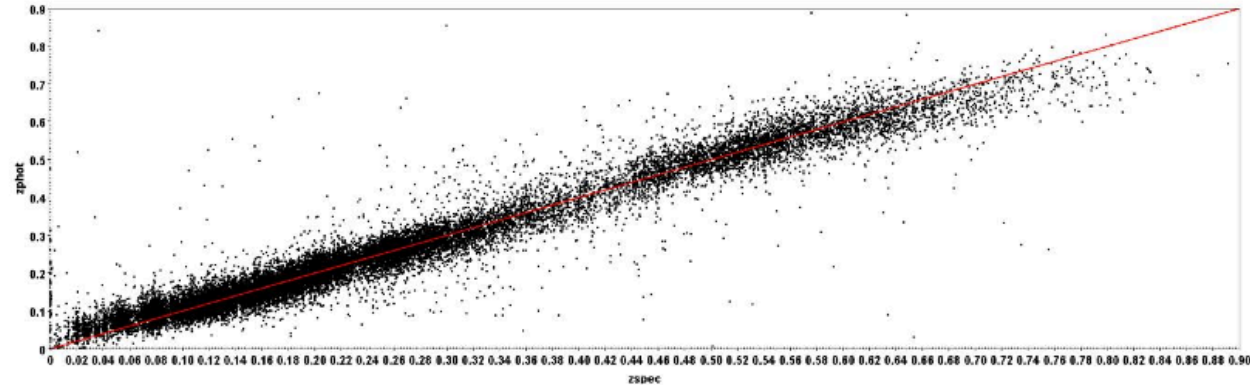


$z=0.5$



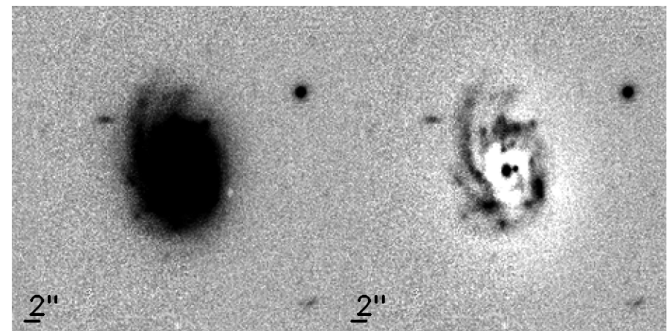
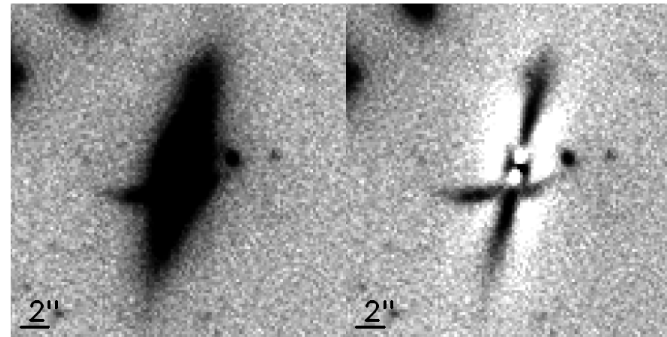
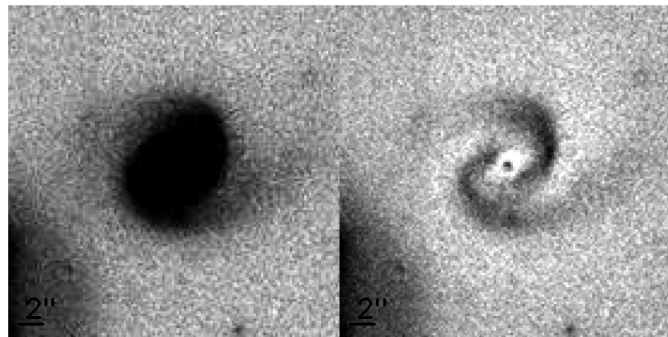
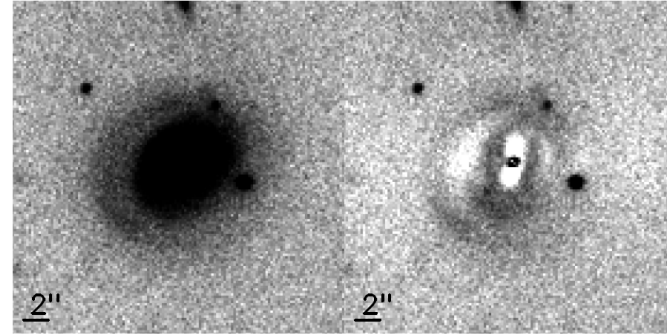
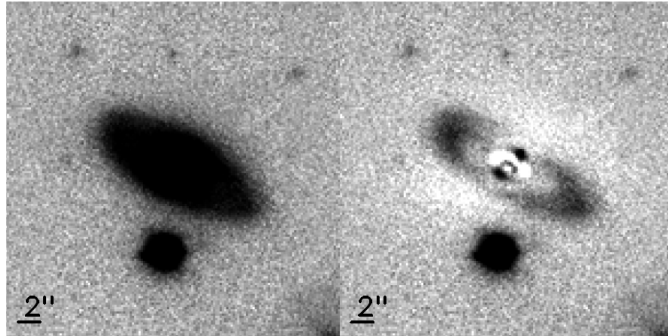
Cavuoti, Brescia, Tortora, Longo, et al. Cavuoti et al., METAPHOR: a new method ...MNRAS submitted;  
 Cavuoti et al., A cooperative approach among methods for photometric redshifts estimation (KIDS) MNRAS, submitted

## Machine learning tools for photo-z and galaxy classification



REF	ALL OK Photo	E type	Sbc type	Scd type	E+Sbc+Scd type	SB type	Im type	unknown type
number	22362	14806	5163	1872	21841	81	117	323
%		66.21	23.09	8.37	97.67	0.36	0.52	1.44
bias  (DAME)	0.0008	0.0009	0.0011	0.0008	0.0008	0.0002	0.0008	0.0009
bias  (SED1)	0.0043	0.0025	0.0067	0.0235	0.0053	0.1814	0.0686	none
bias  (SED2)	0.0274	0.0425	0.0004	0.0211	0.0269	0.1261	0.0506	none
sigma (DAME)	0.0300	0.0262	0.0350	0.0345	0.0293	0.0550	0.0459	0.0533
sigma (SED1)	0.0720	0.0519	0.0813	0.0632	0.0614	0.5371	0.2131	none
sigma (SED2)	0.0725	0.0528	0.0803	0.0575	0.0651	0.4790	0.1820	none
\Delta z/(1+z)  > 0.15 (DAME)	82	34	29	9	72	3	2	5
% (DAME)	0.37	0.23	0.56	0.48	0.33	3.70	1.71	1.55
\Delta z/(1+z)  > 0.15 (SED1)	523	243	202	45	490	16	17	none
% (SED1)	2.37	1.64	3.91	2.40	2.24	19.75	14.53	none
\Delta z/(1+z)  > 0.15 (SED2)	437	161	202	45	408	13	16	none
% (SED2)	1.98	1.09	3.91	2.40	1.87	16.05	13.68	none
\Delta z/(1+z)  > 2*sigma* (DAME)	703	360	189	76	625	12	5	61
% (DAME)	3.14	2.43	3.66	4.06	2.86	14.81	4.27	18.89
\Delta z/(1+z)  > 2*sigma* (SED1)	4132	2121	1484	474	4079	26	27	none
% (SED1)	18.75	14.33	28.74	25.32	18.68	32.10	23.08	none
\Delta z/(1+z)  > 2*sigma* (SED2)	7651	5902	1335	368	7605	24	22	none
% (SED2)	34.72	39.86	25.86	19.66	34.82	29.63	18.80	none

## Sample of substructures



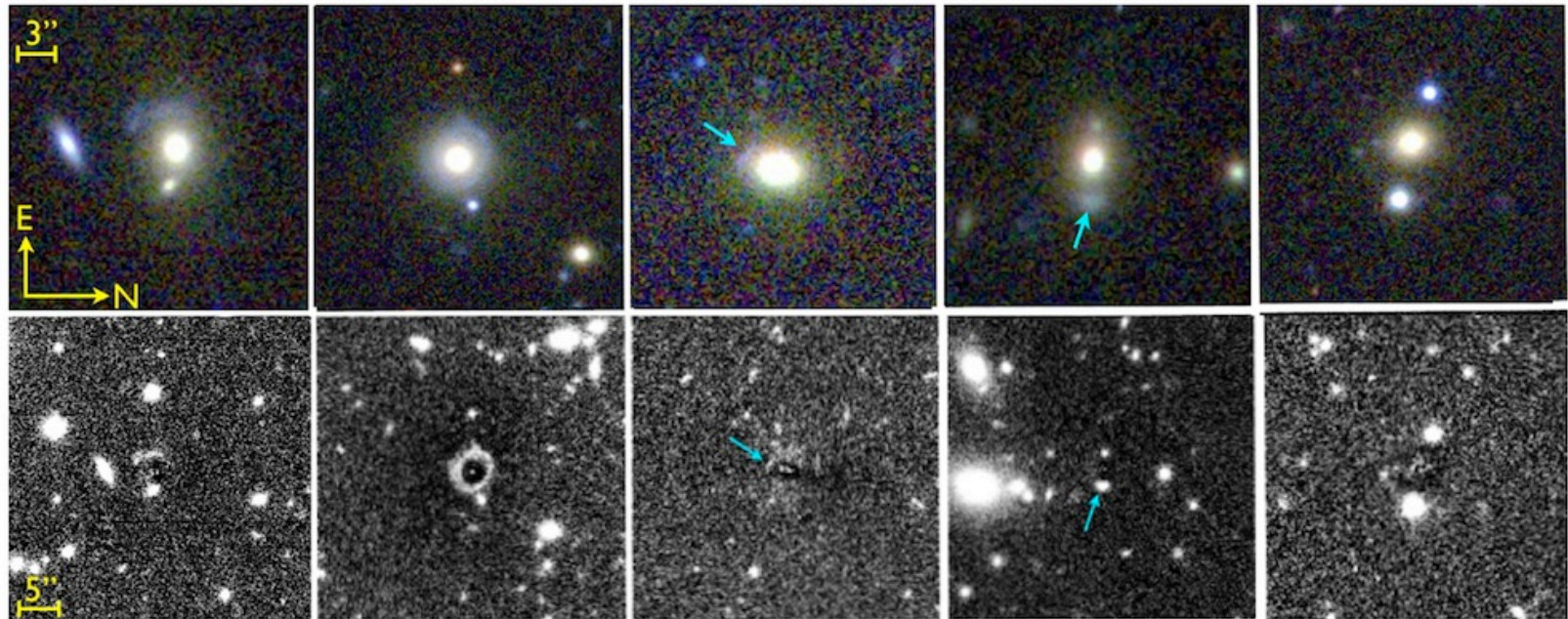
**Bad fit** ( $\chi^2 > 1.5$ , 5-10% of the selected sample)



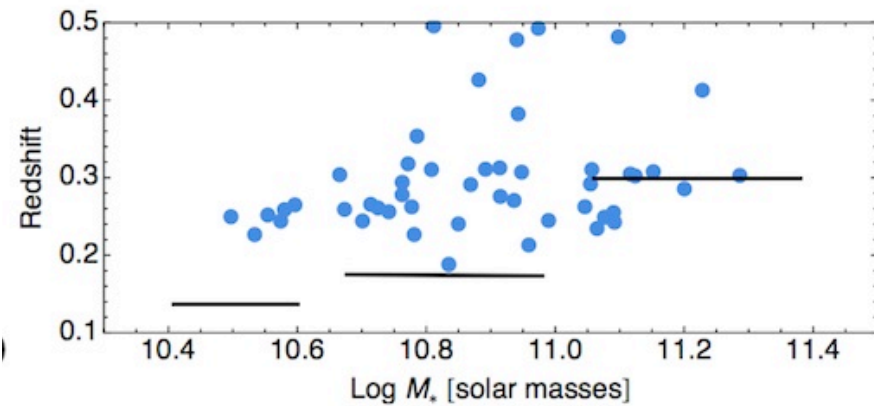
# Analysis tools



## Strong lensing



#SL - gal/gal	
now	KiDS
~650	~1500





# Analysis tools



## Strong lensing – web interface for visual inspection

Image ID:  File View Zoom Scale Color Region WCS Analysis Help

#SL - gal/gal	
now	KiDS
~650	~1500

**No Lens:**

**Maybe Lens:**

**Sure Lens:**



# Big Data



## Numbers

structural measurements and ugrizy photometry for  $4 \times 10^9$  galaxies at  $z < 1.5$

$\sim 2 \times 10^{10}$  galaxies to be analyzed!!

## Expected process time for the 4B gals in 6 bands TODAY

$\sim 300$  gal/FPU/hour  $\rightarrow \sim 3 \times 10^6$ /FPU/yr  $\rightarrow$

for  $\sim 2 \times 10^{10}$  galaxies:  $\sim 7000$  yr/FPU  $\rightarrow$  3.5yr with 2000 cores



# Big Data



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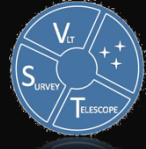
## Expected process time for the 4B gals in 6 bands TODAY

$\sim 1000$  gal/FPU/hour  $\rightarrow \sim 1 \times 10^6$ /FPU/yr  $\rightarrow$

for  $\sim 2 \times 10^{10}$  galaxies:  $\sim 2000$  yr/FPU  $\rightarrow$  1yr with 2000 cores

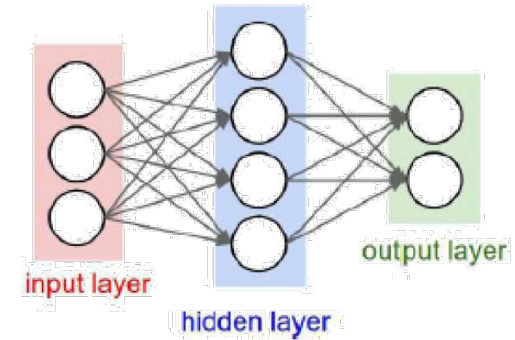


# Analysis tools



## Strong lensing – machine learning tools (convnets)

We need large datasets of known strong lenses in order to learn the classification lens-no vs. lens ( $\sim 10^3$ - $10^6$ ), but such a “training set” is not still available!

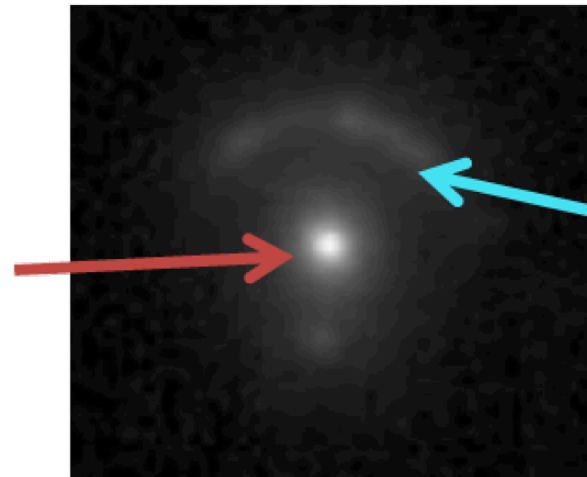


**Mock data is needed to train the network**



Google's artificial neural network

KiDS real galaxy



Simulated arc

Petrillo et al. in preparation

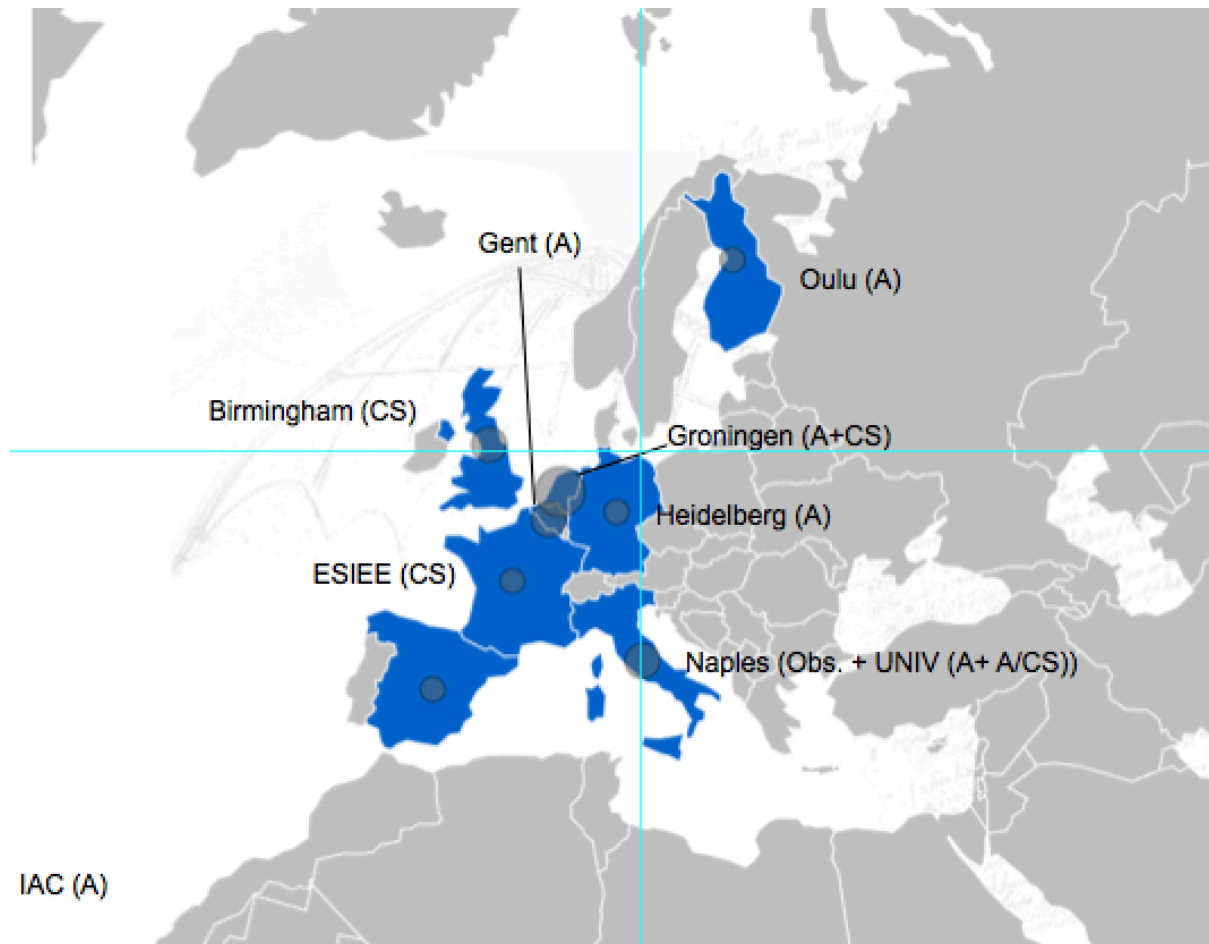




# SUNDIAL



## GALAXY EVOLUTION and BIG DATA (2017-2021)





# SUNDIAL



## GALAXY EVOLUTION and BIG DATA (2017-2021)

- IBM (Zürich) Cloud and Computing Infrastructure, and Cognitive Computing and Computational Sciences.
- TARGET Holding (Groningen) Big Data systems for Business Applications
- ADCIS (Caen) Imaging applications
- VICOMTECH (San Sebastian) computer vision, computer graphics and interaction
- CLEVER-FRANKE (Utrecht) Data visualization, design and development



# SUNDIAL



## GALAXY EVOLUTION and BIG DATA (2017-2021)

**Interdisciplinary collaboration of astronomers and computer scientists to determine novel algorithms to study galaxy evolution. In particular:**

- (1) Automatic detection of faint low surface brightness galaxy features
- (2) Automated object recognition in Big Data sets
- (3) Simulations of galaxy interaction, their characterisation and visualisation



# SUNDIAL

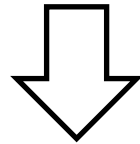


## GALAXY EVOLUTION and BIG DATA (2017-2021)

- 14 PhD Students (2 in Naples) will work on the topics just mentioned
- Start date: 1 June 2017
- Number of students: Groningen (4), Birmingham (2), Gent (2), Naples (2), Heidelberg (1), IAC (1), Oulu (1), ESIEE (1)
- Every student will have a secondment of 6 months at a partner university or 3 months at a partner university and 3 months at a partner company.
- Yearly network meetings
- Training activities, at annual meetings, or in between

# Conclusions

- 1) LSST is an optical machine to use for galaxy evolution (up to  $z \sim 1.5$ )
- 2) LSST can be used for Strong and Weak lensing studies
- 3) There are many other science topics related (Galaxy Cluster search, AGN variability)
- 4) LSST needs strong investment in terms of technological developments for automated tools for galaxy classification, pattern/feature recognition etc.
- 5) LSST has strong capabilities for multi-instrument synergies (astronomy), multi-disciplinarity (academy), industrial spin-off (industrial involvement)



**PREMIALE LSST**

