

# Galaxy clusters and weak lensing studies with LSST

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ENIGMASS Annual Plenary Meeting

December 9th, 2016, LAPP



**LSST** is an instrument designed to make **high precision images** of the **whole accessible sky in 4-D (x, y, z, t)**

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A 10 year time-lapse movie of the southern sky

## **Time domain science**

- Novae – Supernovae – GRBs
- Source characterization
- Instantaneous discovery

## **Moving sources**

- Asteroids and comets
- Proper motions of stars

## **Mapping the Milky Way**

- Tidal stream
- Galactic structure
- Complementary to GAIA

## **Dark energy and dark matter**

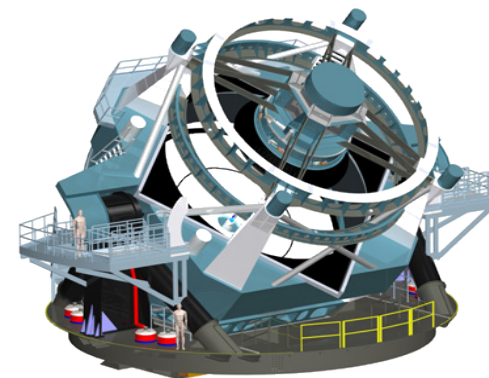
- Gravitational lensing (strong and weak)
- Evolution of large scale galactic structures
- Trace the nature of dark energy

3 keywords : **Fast – Wide – Deep**

Average seeing: 0.67 arcsec



November 16th

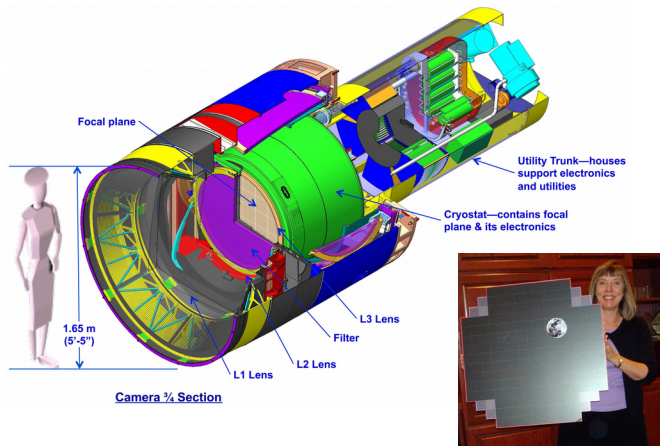


## Telescope

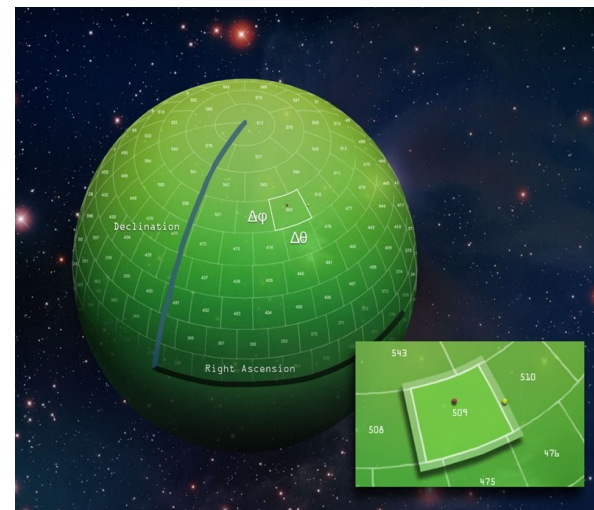
- 8.4 m (6.7m effective)
- Fully corrected (sphericity, coma, astigmatism)
- A 350 tons mobile structure

## Camera

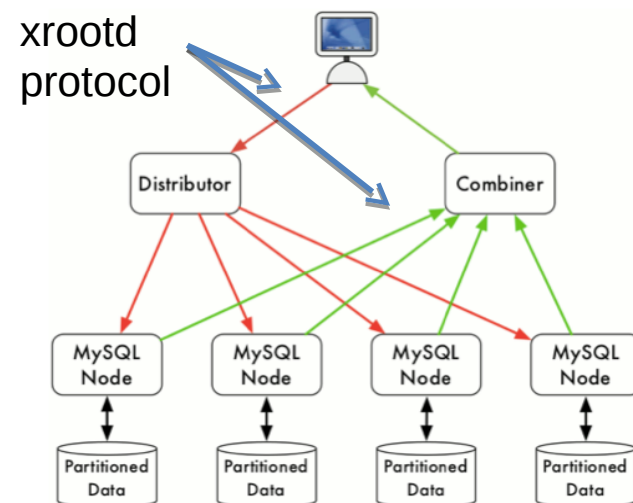
- 3.2 billion pixels @ 0.2 arcsecond / pixel
- 21 rafts
- 9 CCD / raft



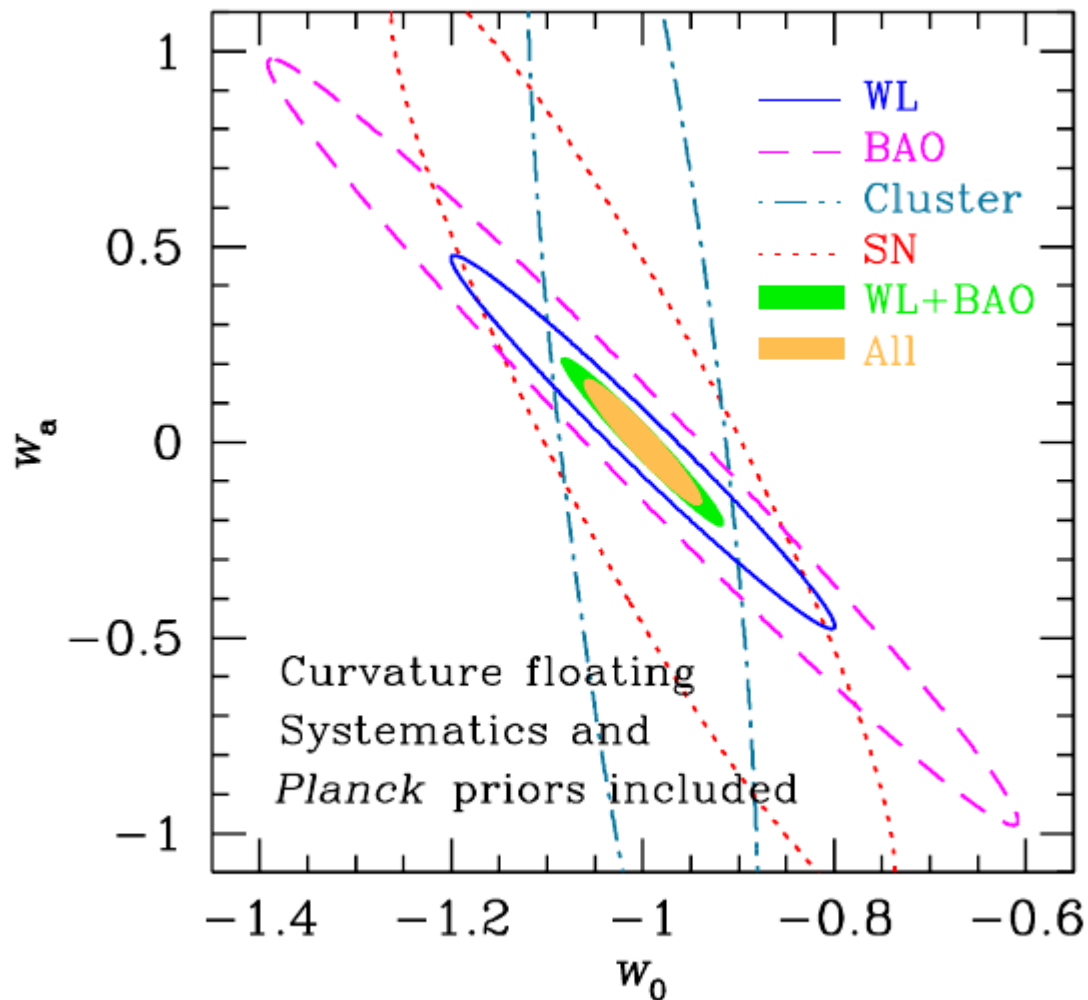
- LSST software: the stack
  - Fully modular, efficient and versatile image analysis framework
  - Open source - [github link](#)
  - Designed to support several instruments:
    - LSST - SDSS – HSC – CFHT – DES

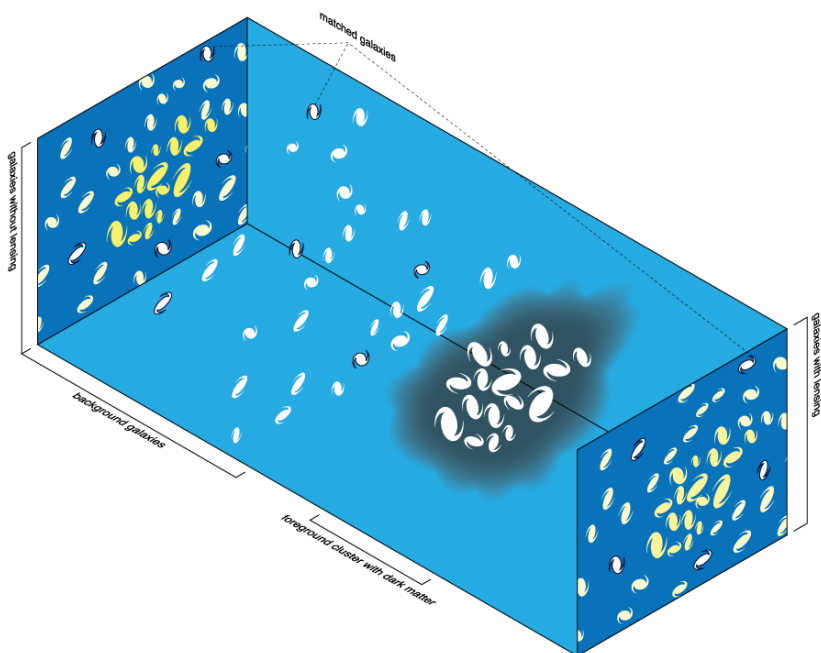


- LSST database: Qserv
  - SQL database system able to store trillions of objects while keeping a reasonable access time
  - Design optimized for astronomical queries
  - Massively parallel – distributed – fault tolerant **relational database**



## Joint probes analysis





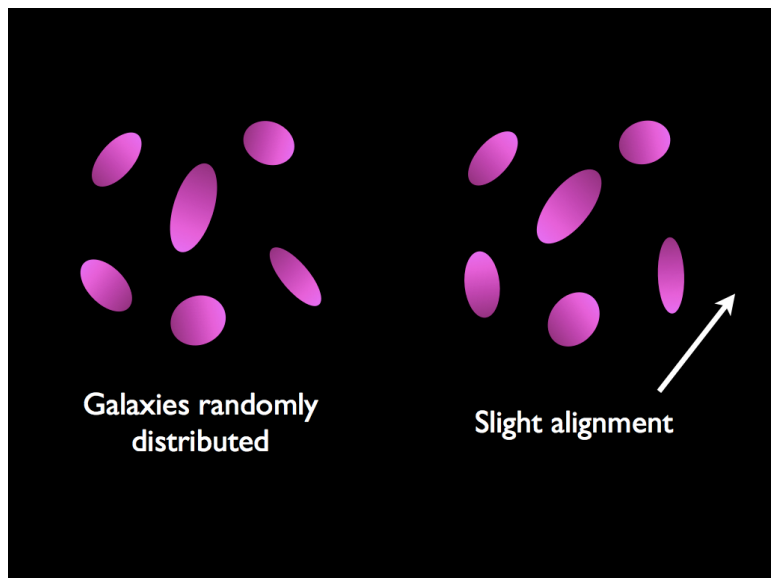
- Gravitational potential created by the mass in between a galaxy and us will change the light trajectory
- Consistent modification of background galaxies shape
- Statistical analysis of weakly lensed galaxies
- Probe the Universe at different scales &  $z$

## Mass measurement of relaxed galaxy clusters

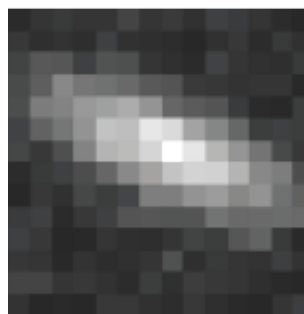
- X-Ray, SZ  $\rightarrow$  baryonic mass
- WL  $\rightarrow$  total mass
- Representative sample of the Universe  $\rightarrow \Omega_b / \Omega_m$
- CMB  $\rightarrow \Omega_b \Rightarrow$  and we get  $\Omega_m$

Precise and robust measurement of  $\Omega_m$





Hypothesis: galaxies are intrinsically elliptic and randomly oriented  $\rightarrow$  null ellipticity in average

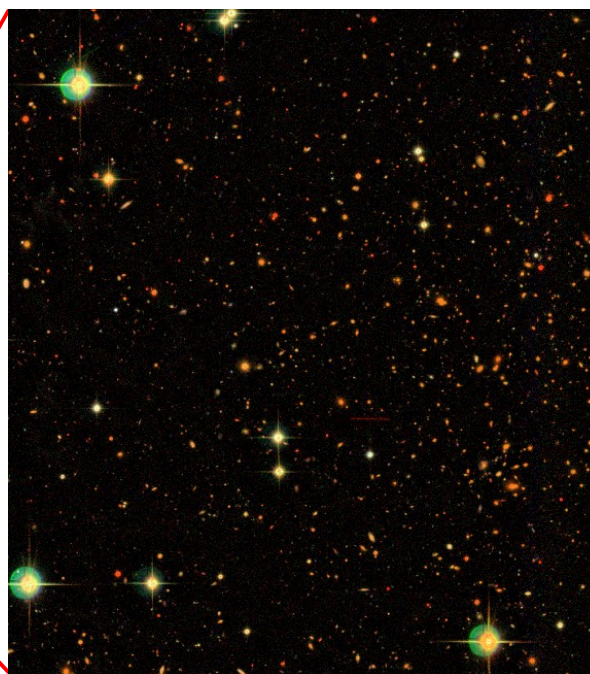
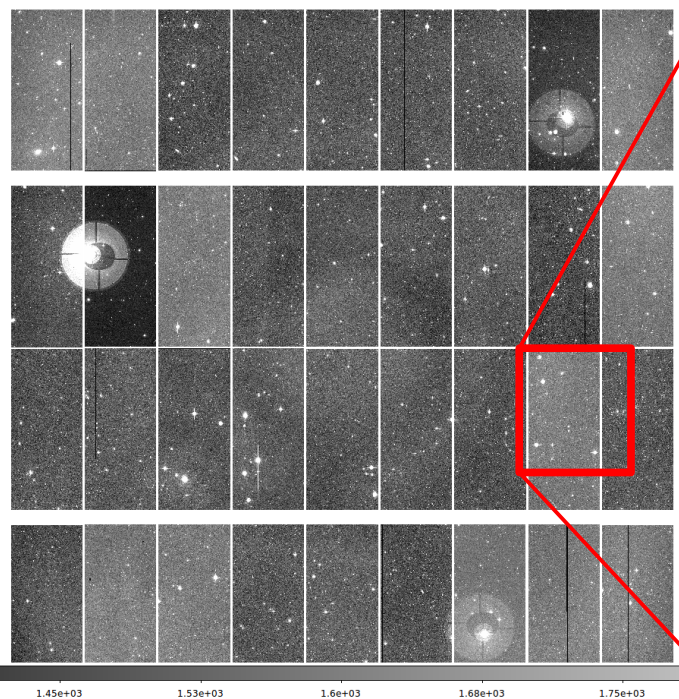


Pixels  $\Rightarrow$  second moments  $Q_{ij}$

$$\epsilon = \frac{Q_{11} - Q_{22} + 2iQ_{12}}{Q_{11} + Q_{22} + 2(Q_{11}Q_{22} - Q_{12}^2)^{1/2}}$$

- Measured ellipticity is a function of the intrinsic ellipticity of the galaxy  $\epsilon^{(s)}$  and a quantity that characterizes the shear  $g$
- In the limit of weak lensing  $|g| < 1$ :  $\epsilon^{(s)} = \frac{\epsilon - g}{1 - g^* \epsilon}$
- If we suppose that the intrinsic orientation is random:  $\langle \epsilon \rangle = g$
- Not exactly true: intrinsic alignment of galaxies  $\rightarrow$  systematic effect

- The goal is to **develop a complete pipeline for cluster analysis in the LSST stack framework**
- Current input data are CFHT images in the 5 ugriz filters
- Three clusters under reprocessing and being analyzed



**MACSJ2243.3-0935** ( $z=0.447$ )

CL0016+16 ( $z=0.541$ )

3C295 ( $z=0.464$ )

Color coding :R = l; G = r; B = g

u(5), g(6), r(9), i(12), z(10)



## Clusters python package: A step by step analysis

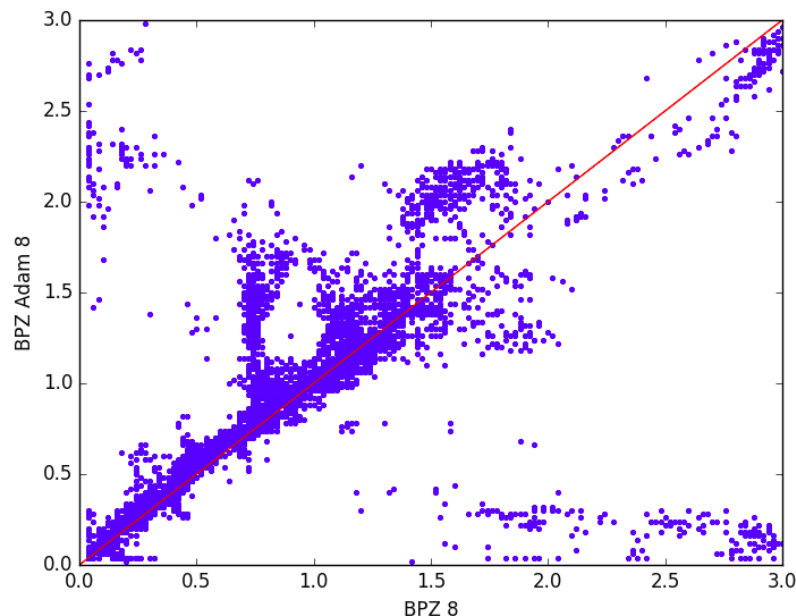
- **Data format:** easier way to access the LSST data:  
LSST stack format → Astropy tables in hdf5 files
- **Data validation:** quality assessment of the data processing (color locus, ellipticity, etc)
- **Extinction:** correct for the MW extinction – try several available dust maps – check related systematic uncertainties
- **Photometric redshift:** wrapper to several photometric redshift estimator codes
- **Galaxy selection:** red sequence + redshift cuts + quality cuts
- Averaged tangential and cross **shear** as a function of redshift
- **Mass estimate**

- Template fitting methods (redshift, spectral type, and extinction) + prior on  $z$  given a magnitude

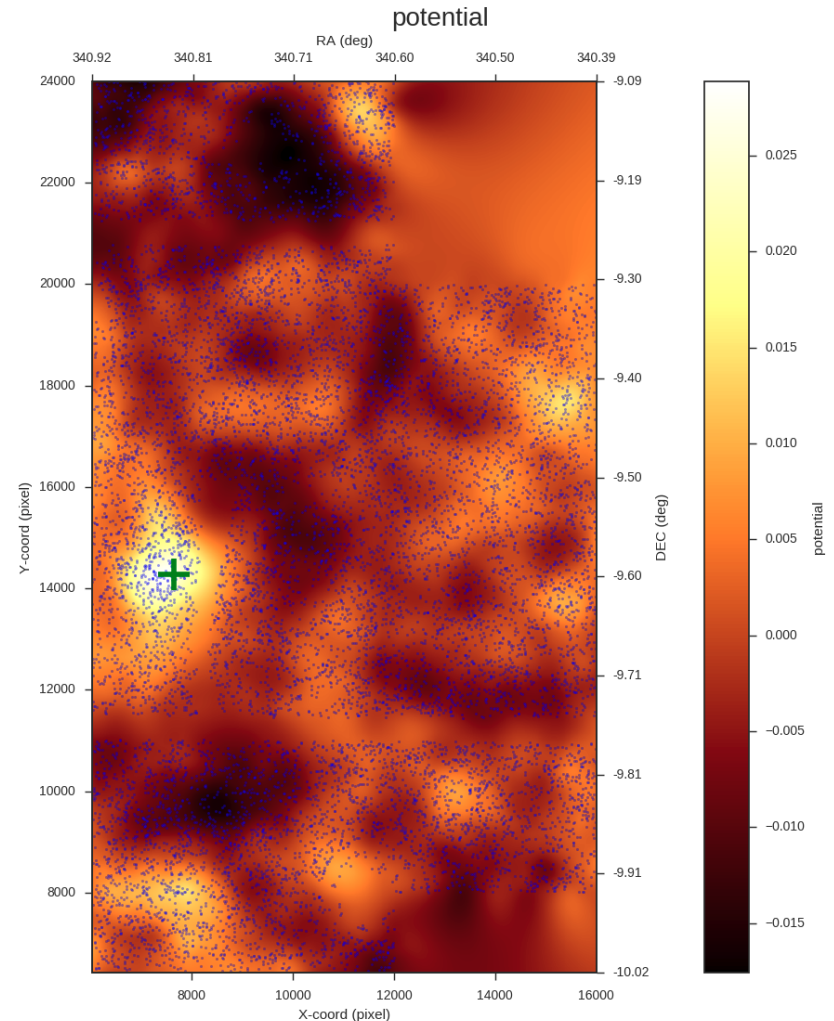
$$\chi^2(z, T, E(B - V), N) = \sum_{i=1}^{N_{\text{bandes}}} \left( \frac{F_i^{\text{obs}}(m_i) - N F_i^{\text{mod}}(z, T, E(B - V))}{\sigma(F_i^{\text{obs}}(m_i, \sigma(m_i)))} \right)^2$$

$$p(z | m_0) = \sum_T p(T | m_0) p(z | T, m_0)$$

- Photometric redshift needed to select lensed galaxies in the background of the cluster
- A wrapper to several photometric redshift estimators included in the Clusters pipeline (BPZ, Lephare)
- Currently testing different codes and configurations



- Code to estimate the mass has been implemented very recently  
→ Currently testing it
- But we can still produce different maps related to the mass
- Here, the map showing the lensing potential integrated along the line of sight
- The cluster is located at the cross position, where the potential is the strongest



- Reprocessing : Automate, debug, quality assessment, new clusters
- Qserv: Test it on real data and implement its use in the analysis
- Analysis
  - Clean and robustify the [Clusters](#) pipeline
  - Reproduce known results on known clusters
  - Study all known and potential systematics
    - Extinction – try different maps and propagate
    - Photo-z – use of different templates, codes, methods
    - Galaxy selections – red sequence, redshift and other cuts
  - Go beyond mass estimate – cosmology
- **Work done in the official DESC clusters working group**
- **First complete analysis done on real data using the full LSST stack**