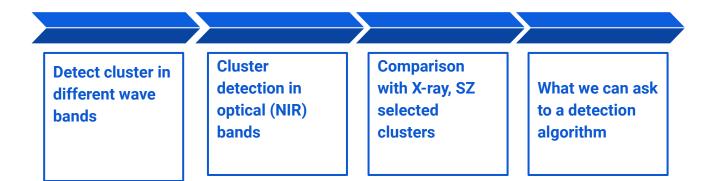


# Built an optically selected galaxy clusters catalogue

# **Barbara Sartoris**

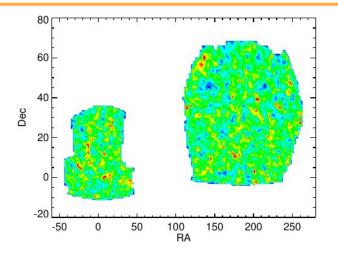
Universitaets-Sternwarte Muenchen Ludwig-Maximilians Universitaet

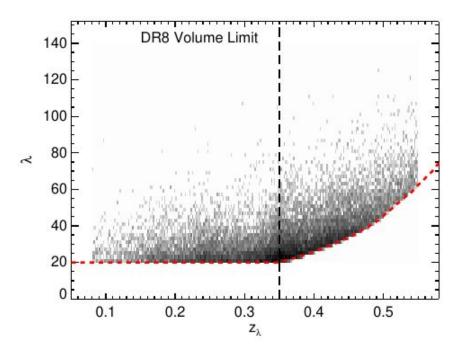


REDMAPPER: clusters are found as overdensities of red-sequence galaxies.

Iterative self-trained red sequence model with redshift evolution. It uses all colors from *ugriz*. Red sequence model+radial and luminosity filters.

Richness is the sum of the membership probabilities.





Cluster catalog > 25000 with Richness > 20 redshift [0.08,0.55] fmask < 0.2 from SDSS DR8 galaxy photometric catalogue in 10000 deg2

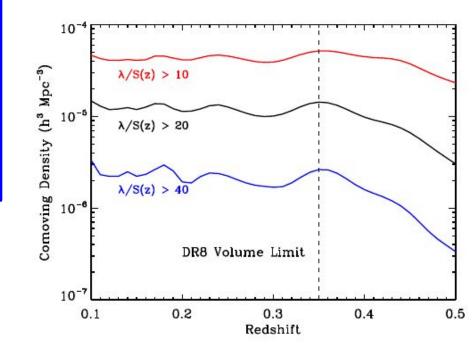
#### Rykoff+13

#### **Barbara Sartoris**

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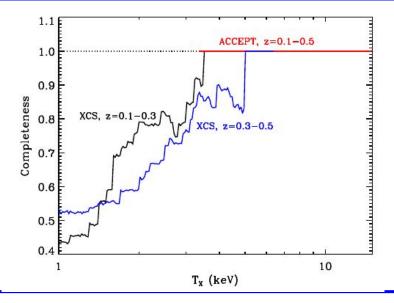
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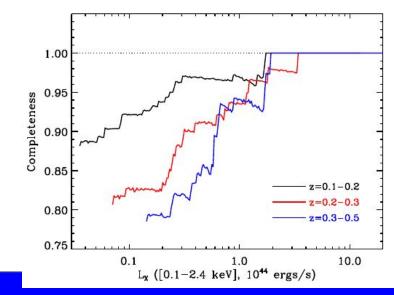
**Barbara Sartoris** 



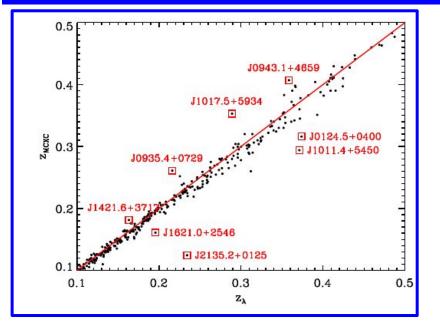
XCS (XMM Cluster Survey, Mehrtens+12) serendipitously detected clusters. Of these, 402 with temperature estimations (not core-excised).

ACCEPT: compilation of cluster catalog with deep Chandra

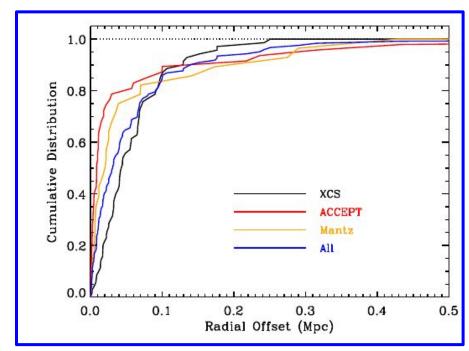
MCXC (Meta-Catalog of X-ray detected Clusters of galaxies, Piffaretti+2011): RASS + serendipitous clusters ROSAT



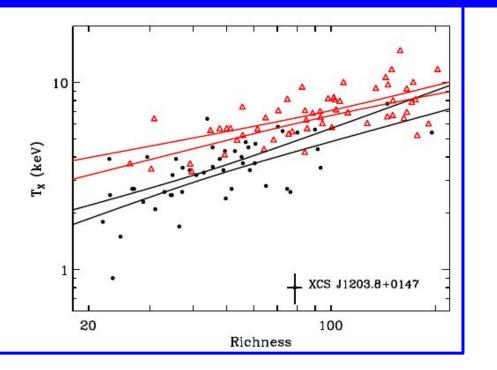
#### Rozo & Rykoff+14



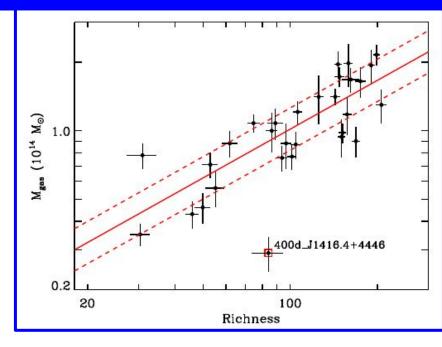
Comparison wrt XCS, ACCEPT, and MCXC cluster samples



**Barbara Sartoris** 



Comparison wrt XCS, ACCEPT, and MCXC cluster samples



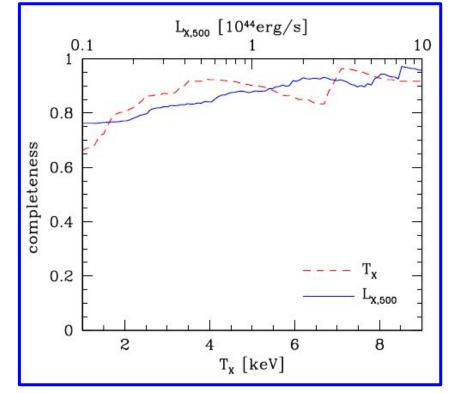
Rozo & Rykoff+14

# **CAMIRA (Cluster finding Algorithm based on Multi-band Identification of Red-sequence gAlaxies)**

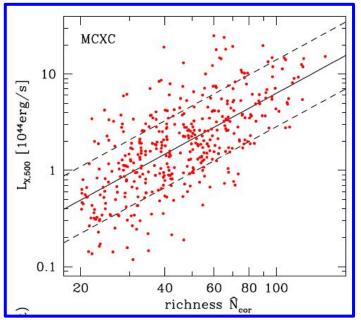
CAMIRA fits all photometric galaxies with a SPS model of Bruzual & Charlot (2003) to compute likelihoods of being red-sequence galaxies as a function of redshift. The model is calibrated using spectroscopic galaxies, which are used to derive residual colors of SPS model fitting as a function of wavelength and redshift.

Richness: number of red member galaxies with stellar masses  $M^* > 10^{10.2}$  Msun within R < 1 Mpc/h Center is the BCG

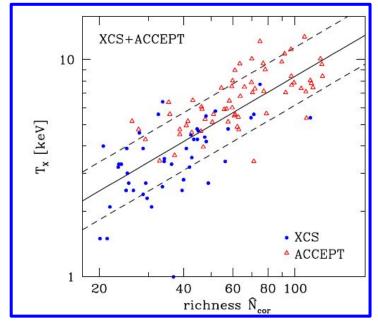
Completeness wrt XCS, ACCEPT, and MCXC cluster samples



# **CAMIRA (Cluster finding Algorithm based on Multi-band Identification of Red-sequence gAlaxies)**

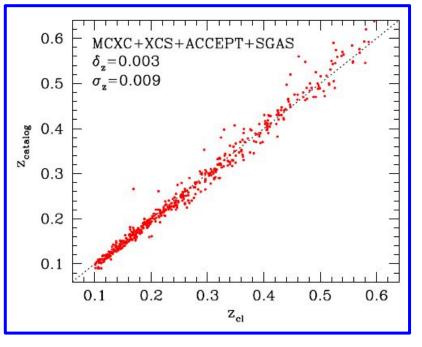


Comparison wrt XCS, ACCEPT, and MCXC cluster samples

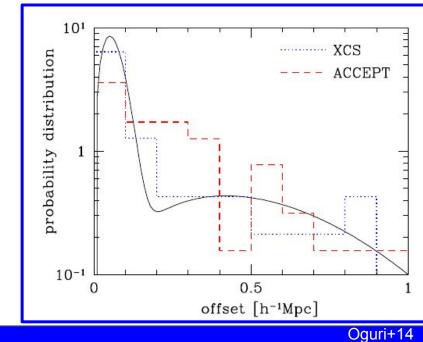




# **CAMIRA (Cluster finding Algorithm based on Multi-band Identification of Red-sequence gAlaxies)**



Comparison wrt XCS, ACCEPT, and MCXC cluster samples



**Barbara Sartoris** 

#### YOLO-CL (You only look once)

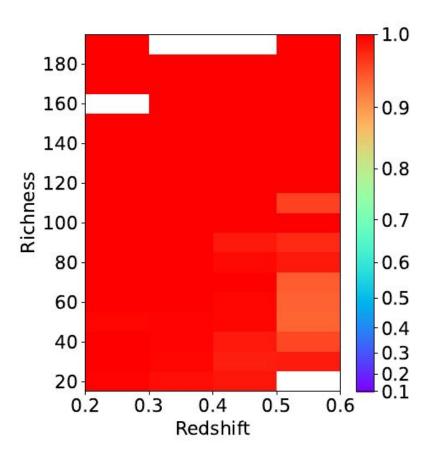
New Machine Learning based algorithm: previous MLs apply "localizer" network on a given image, at multiple locations and at multiple scales, and assign a detection probability.

YOLO applies a single neural network to the full image, combining the detection and classification into a single process.

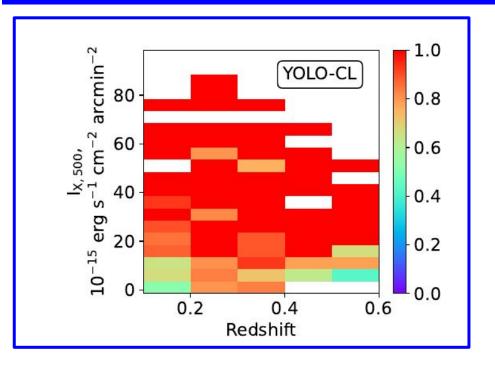
YOLO-CL trained using three color images (with g, r, i) of 12000 from redMaPPer cluster catalog and the SDSS blank field images.

Richness: number of cluster members above a given luminosity.

YOLO-CL vs redMaPPer (SDSS DR8)



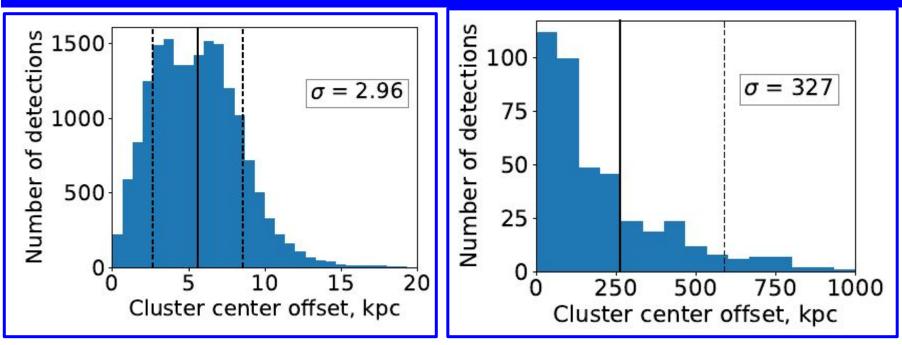
#### **YOLO-CL**



The YOLO-CL cluster detection completeness with respect to MCXC2021 as a function of redshift and mean X-ray surface brightness.

see also Krippendorf+23 on eFEDS

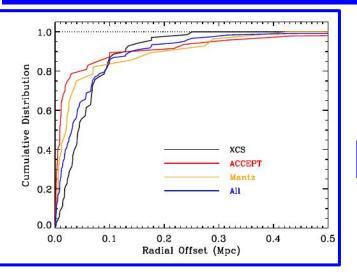
#### **YOLO-CL**

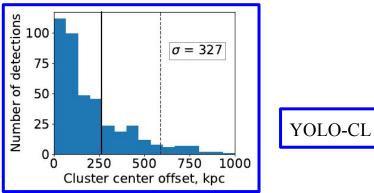


The distribution of the angular distance between cluster centers detected by YOLO-CL and redMaPPer

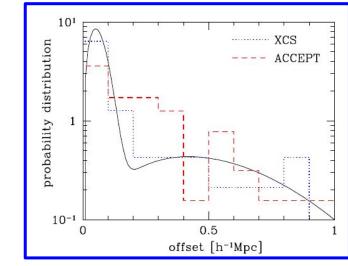
The distribution of the angular distance between cluster centers detected by YOLO-CL and MCXC2021

# **Algorithm comparison**



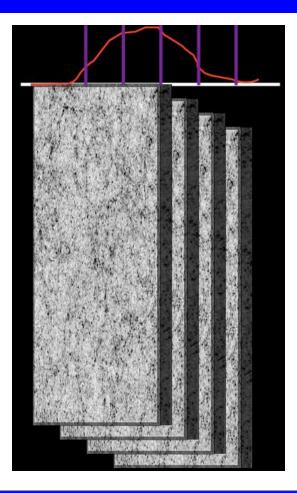








- Use of full P(z) for every galaxy
- Search performed in overlapping redshift slices
- Smoothing using a difference of Gaussians kernel within each slice to detect clusters
  - Merges detection lists from redshift slices

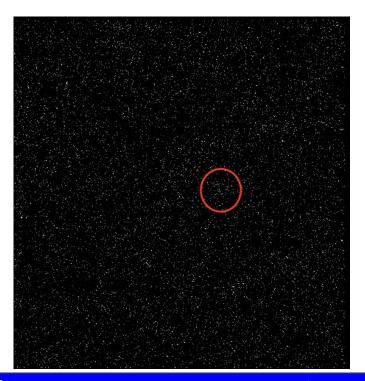


Use of full P(z) for every galaxy

- Search performed in overlapping redshift slices
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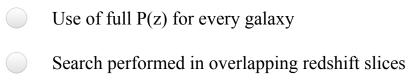
Merges detection lists from redshift slices

For each given redshift slice, insert every galaxy weighted by P(z) - Density map



**Barbara** Sartoris

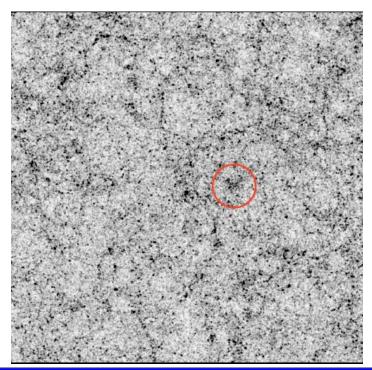
#### Gonzalez+14, Adam+19



Smoothing using a difference of Gaussians kernel within each slice to detect clusters

Merges detection lists from redshift slices

Smooth with Gaussian difference kernel -> Smoothed map

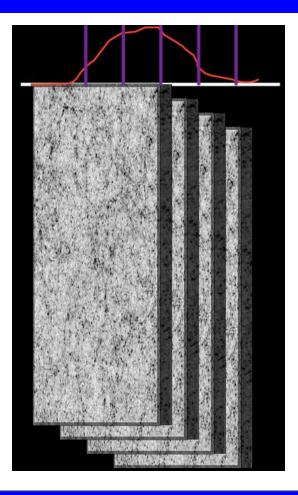


### **PzWav detection algorithm**

- Use of full P(z) for every galaxy
- Search performed in overlapping redshift slices
- Smoothing using a difference of Gaussians kernel within each slice to detect clusters

Merges detection lists from redshift slices

- cluster centroids corresponds to the peak location of each detected overdensity from the smoothed density maps
- the observable is the peak amplitude of each detected overdensity



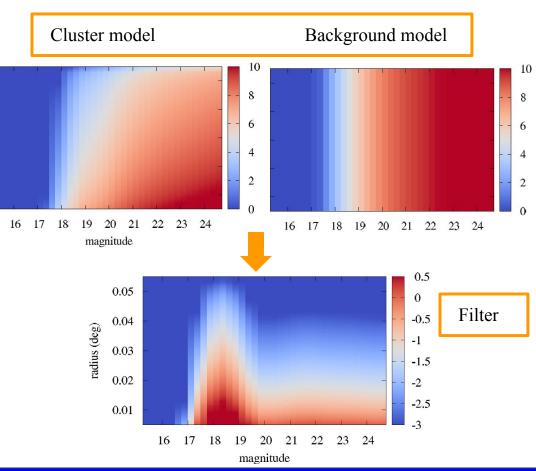
#### **Barbara Sartoris**

#### Gonzalez+14, Adam+19

#### **AMICO detection algorithm**

AMICO = Adaptive Matched Identier of Clustered Objects based on Optimal Filtering

- Definition of the filter given a cluster and background model in each z slice
- Built the amplitude 3D map
- Select candidates
- Galaxy membership probability
- Cleaning map from detection
- Repeat down to the S/N limit



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0.05

0.04

0.03

0.02

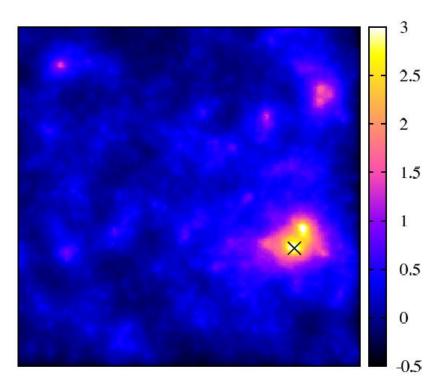
0.01

radius (deg)

#### **AMICO detection algorithm**

AMICO = Adaptive Matched Identier of Clustered Objects based on Optimal Filtering

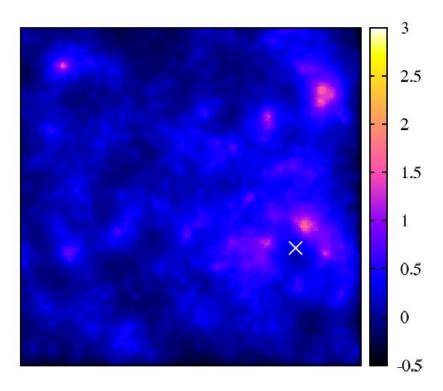
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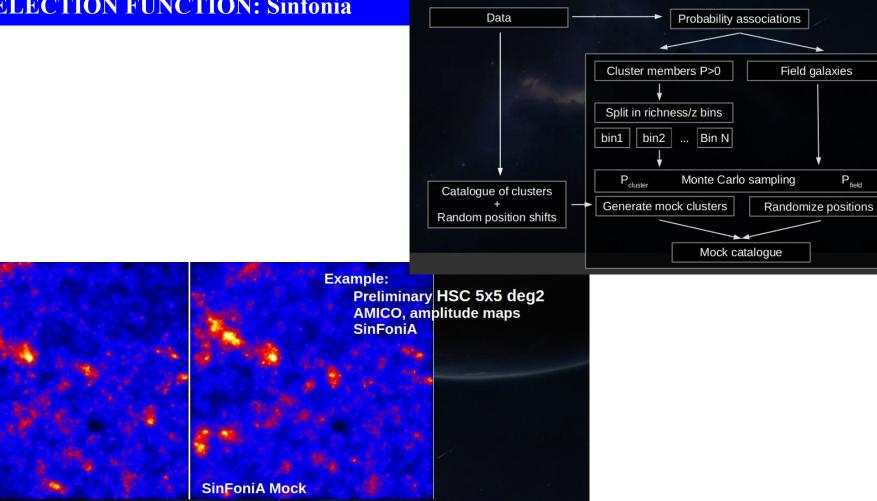
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#### **2)SELECTION FUNCTION: Sinfonia**

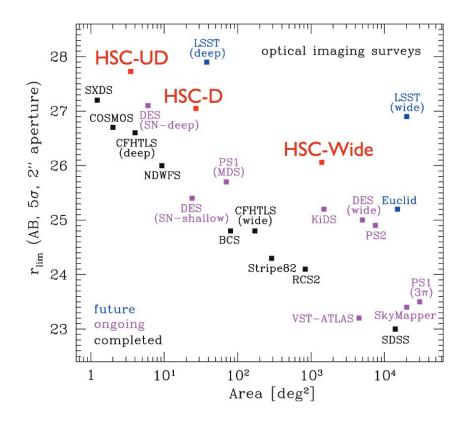
Real



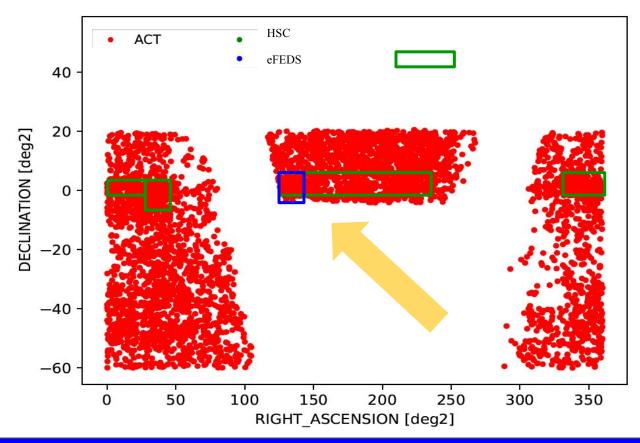
**Barbara Sartoris** 

 $\mathsf{P}_{\mathsf{field}}$ 

HSC = Hyper Suprime Camera (on Subaru telescope)

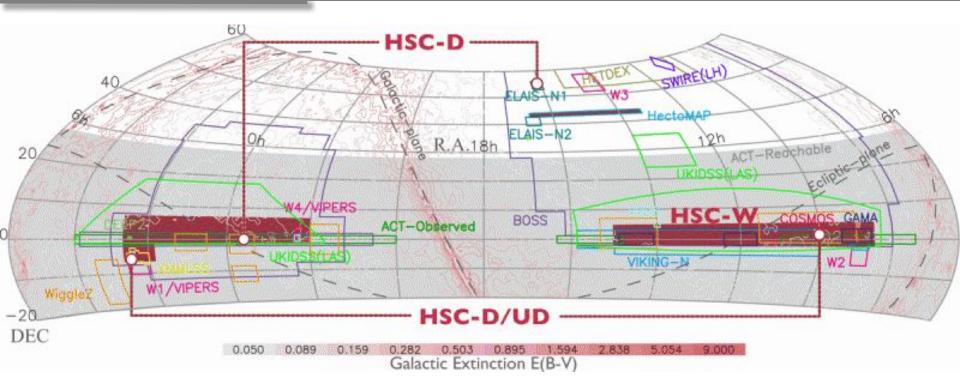


# **Testing survey area**

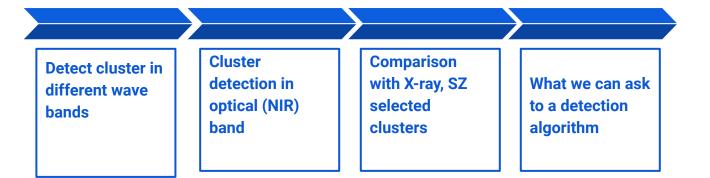


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# **HSC SURVEY**



#### Conclusions



- Model/Training sample: pros&cons of each algorithm
- Properly deal with complicated masks
- Detect clusters on a wide redshift range
- Center definition: relation with cosmological observables
- Cluster observable: well calibrated and characterized observable mass relation
- Computational efficiency
- Unbiased, complete, pure sample at low richness (selection cut)