

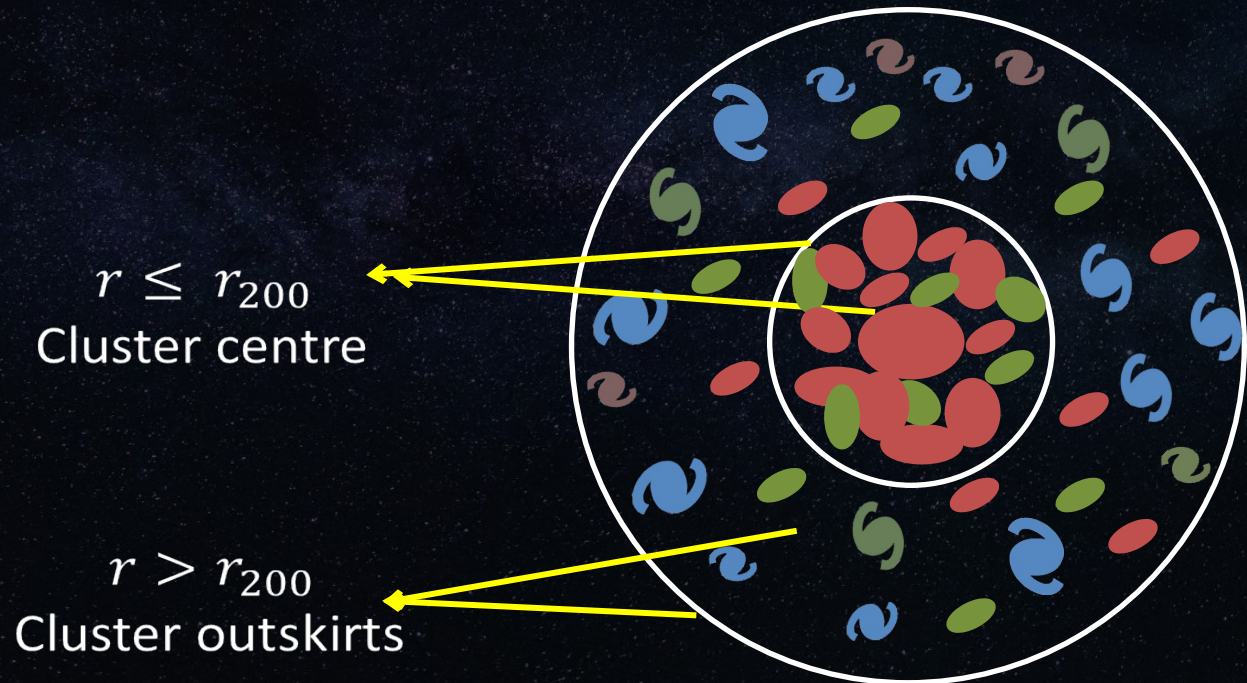


CALSAGOS: CLUSTERING ALGORITHMS APPLIED TO GALAXIES IN OVERDENSE SYSTEMS

Daniela Olave-Rojas

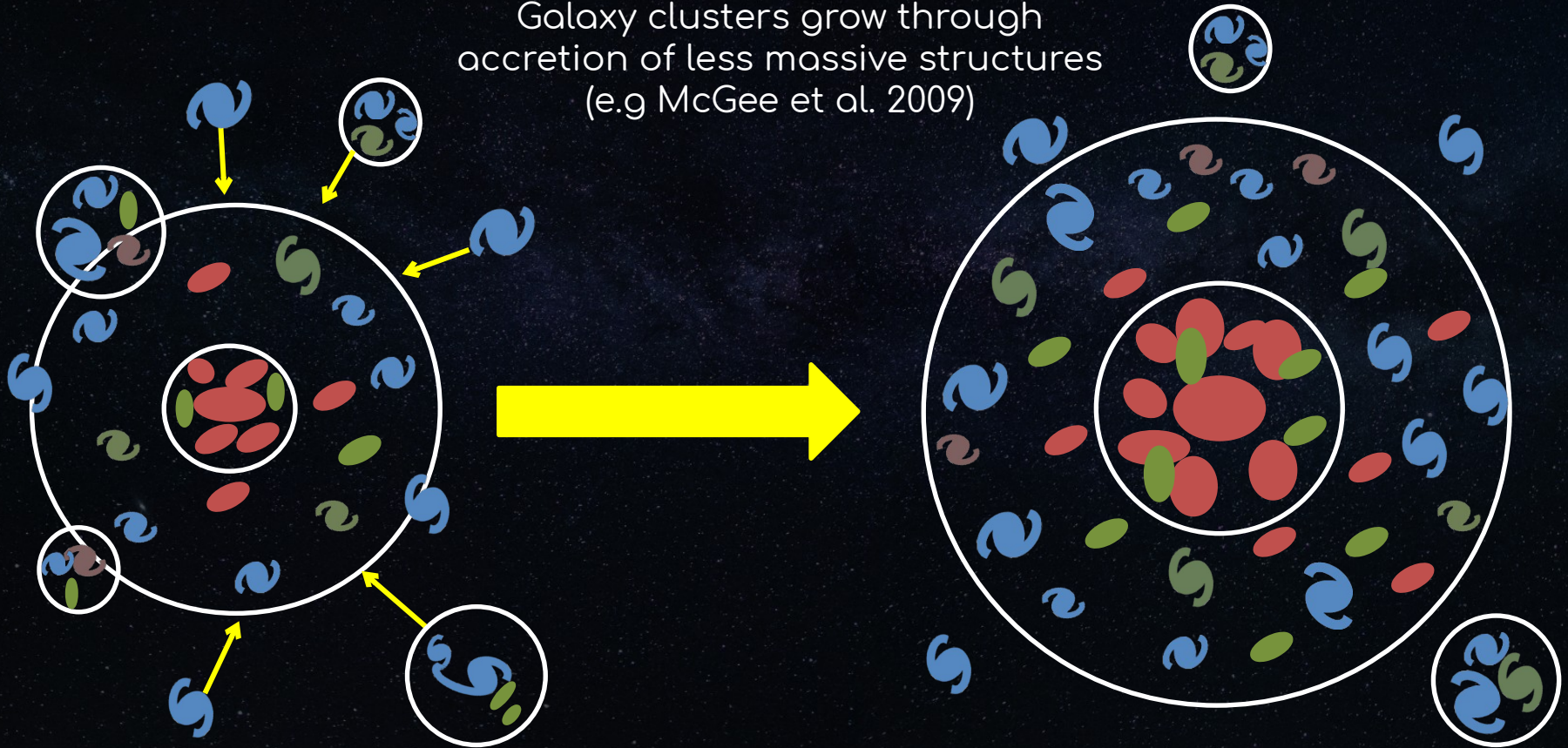
Galaxy Clusters

Cosmic laboratories for the study of the environmental drivers of galaxy evolution (e.g. Dressler 1980, De Lucia et al. 2007, Demarco et al. 2010, Lemaux et al. 2012, Cerulo et al. 2014).



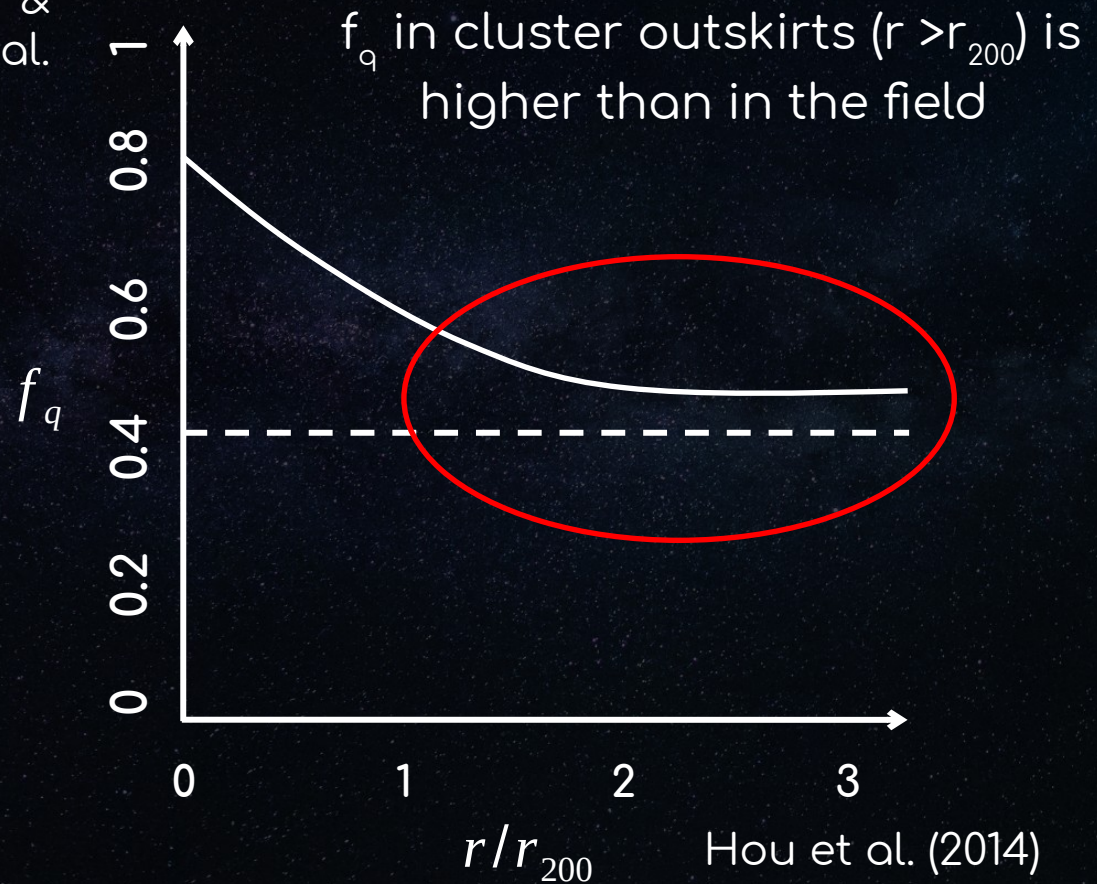
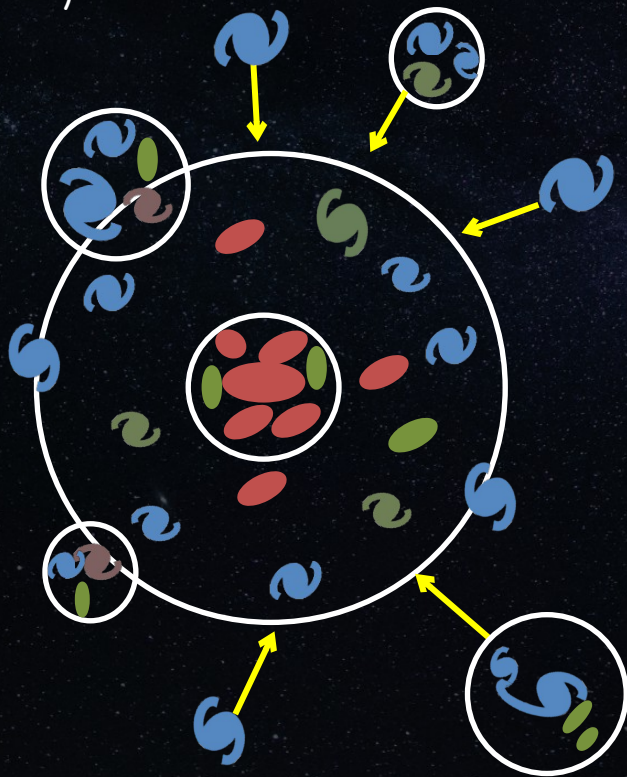
Cluster Mass Assembly in a Hierarchical Universe

Galaxy clusters grow through accretion of less massive structures
(e.g McGee et al. 2009)



Galaxy Pre-Processing

Pre-processing (e.g. Zabludoff & Mulchaey 1998, Fujita 2004, Haines et al. 2015)



The project

Title: Understanding the effect of the environment on the evolution of galaxies

Goal: Understand the link between the evolution of galaxies and the formation of their hosting structures

Data: Photometric data from the Southern Photometric Local Universe Survey (S-PLUS; Mendes de Oliveira et al. 2019) + spectroscopic data from archive

The project

The use of the S-PLUS data allows us to:

- i. identify groups and substructures in and around galaxy clusters, reaching the outermost regions of clusters (up to $\sim 5r_{200}$),
- ii. determine the fraction of passive and star forming galaxies in each environment,
- iii. determine the environmental quenching efficiency in substructures and clusters

CALSAGOS

CALSAGOS Clustering ALgorithmS Applied to Galaxies in Overdense Systems

CALSAGOS is a python package develop to select cluster members and to identify substructures in and around galaxy cluster

CALSAGOS

CALSAGOS uses some pre-existing python modules as:

1. numpy
2. astropy
3. matplotlib
4. sys
5. math
6. sklearn
7. scipy
8. kneebow

CALSAGOS has the following modules:

1. utils
2. redshift_boundaries
3. cluster_kinematics
4. ds_test
5. isomer
6. clumberi
7. lagasu

CALSAGOS

`utils`: functions to estimate errors, convert quantities and estimate distances

`redshift_boundaries`: functions developed to establish the limits in the redshift distribution

`cluster_kinematics`: functions developed to estimate the kinematic properties of the cluster (velocity dispersion, escape velocity, peculiar velocity)

`ds_test`: functions developed to implement the Dressler-Shectman Test (DS-Test, Dressler & Shectman, 1988) in a cluster of galaxies

CALSAGOS

ISOMER: Identifier of SpectrOscopic MembERs allows to identify the spectroscopic cluster members

$$v = c \frac{z - z_{cl}}{1 + z_{cl}}$$

(Harrison 1974)

$$v_{esc} \simeq 927 \left(\frac{M_{200}}{10^{14} h^{-1} M_{\odot}} \right)^{1/2} \left(\frac{r_{200}}{h^{-1} Mpc} \right)^{-1/2} \text{ kms}^{-1}$$

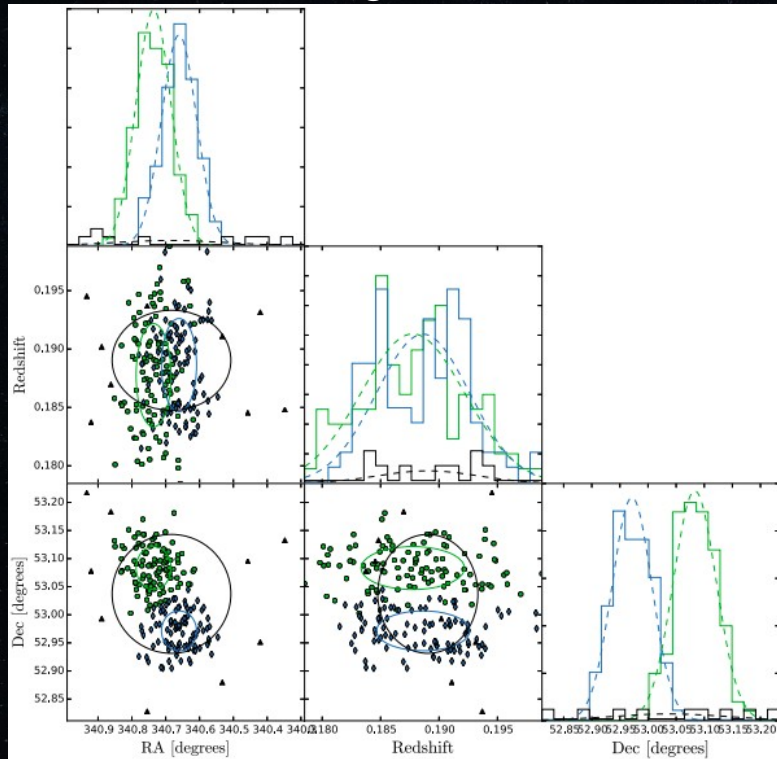
(Diaferio 1999)

r_{200} is estimated by using equation (7) presented by Finn et al. (2005)

Field interlopers are removed through a 3σ clipping algorithm (see Yahil & Vidal 1977).

CALSAGOS

CLUMBER: CLUster MemBER Identifier allows to identify cluster members using a 3D-Gaussian Mixture Modules (GMM)

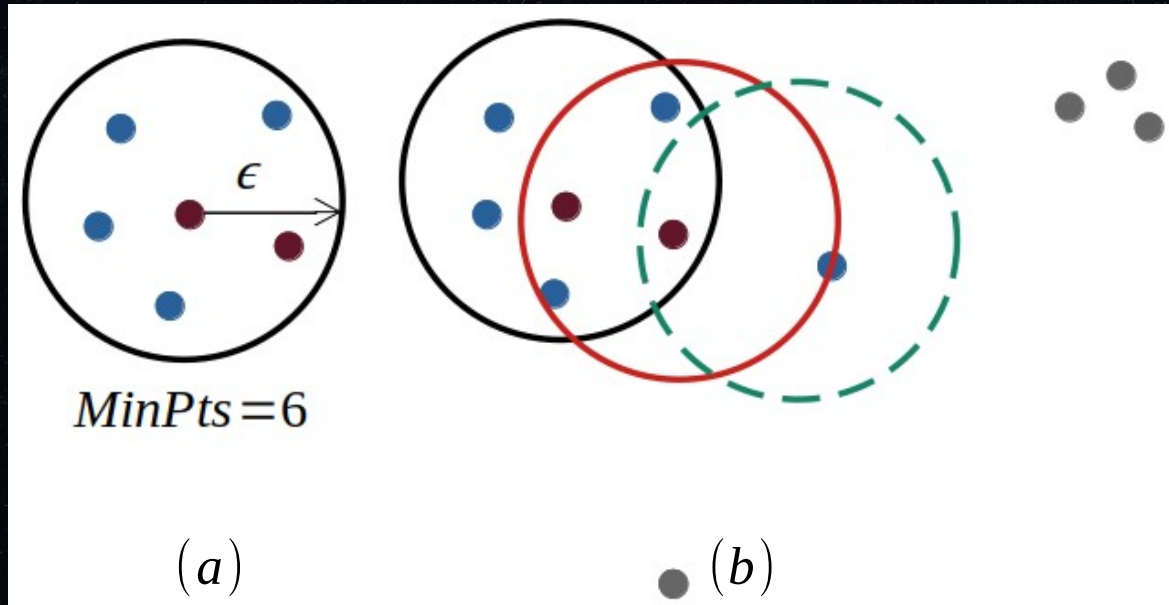


Dawson et al. (2015)

Bayesian Information Criterion (BIC)

CALSAGOS

LAGASU: LAbeller of GALaxies within SUBstructures assigns galaxies to different substructures in and around a galaxy cluster



GMM + DBSCAN

DBSCAN

Density-based spatial clustering of applications with noise (DBSCAN, Ester 1996)

Olave-Rojas et al. in prep.

CALSAGOS ON S-PLUS MOCKS

Developed by Pablo Araya-Araya as part of S-PLUS collaboration (for details see Araya-Araya et al. 2021)

52987 halos with $13.0 \leq \log(m_{200}/m_{\text{sun}}) \leq 15.0$
at $0.006 \leq z \leq 0.6$

$$H = 67.3 \text{ [km s}^{-1} \text{ Mpc}^{-1}\text{]}$$

$$\Omega_{\Lambda} = 0.685$$

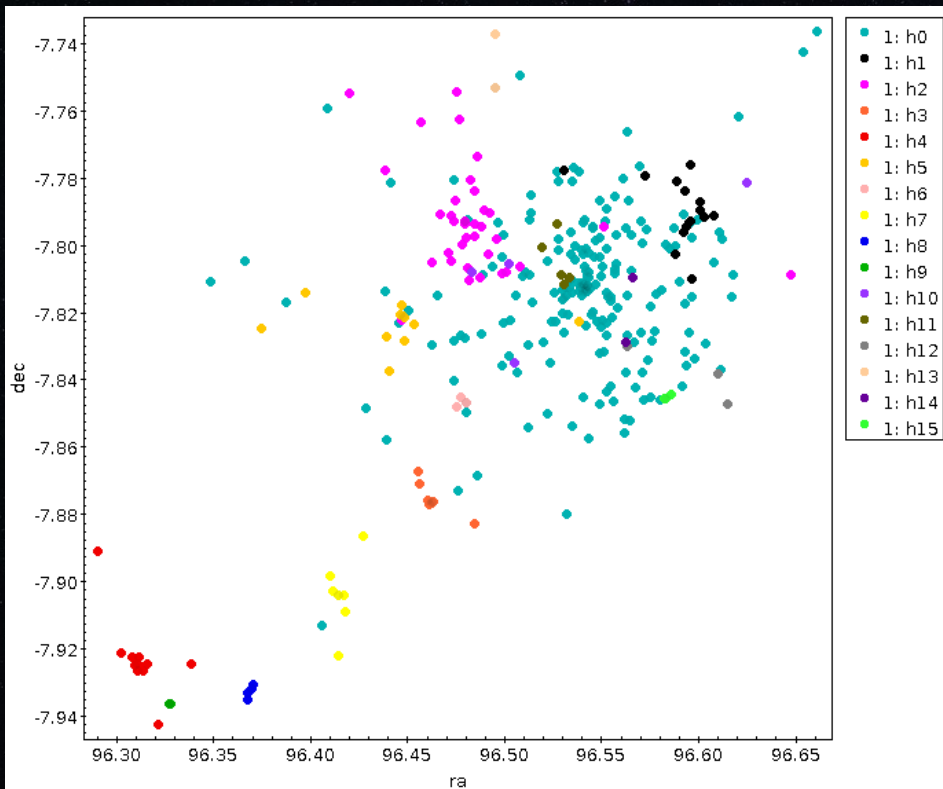
$$\Omega_m = 0.315$$

2524 halos with $\log(m_{200}/m_{\text{sun}}) \geq 14.0$
at $0.007 \leq z \leq 0.6$

419904 galaxies

CALSAGOS ON S-PLUS MOCKS

Original halo + subhalos



We remove subhalos with 2 or less members

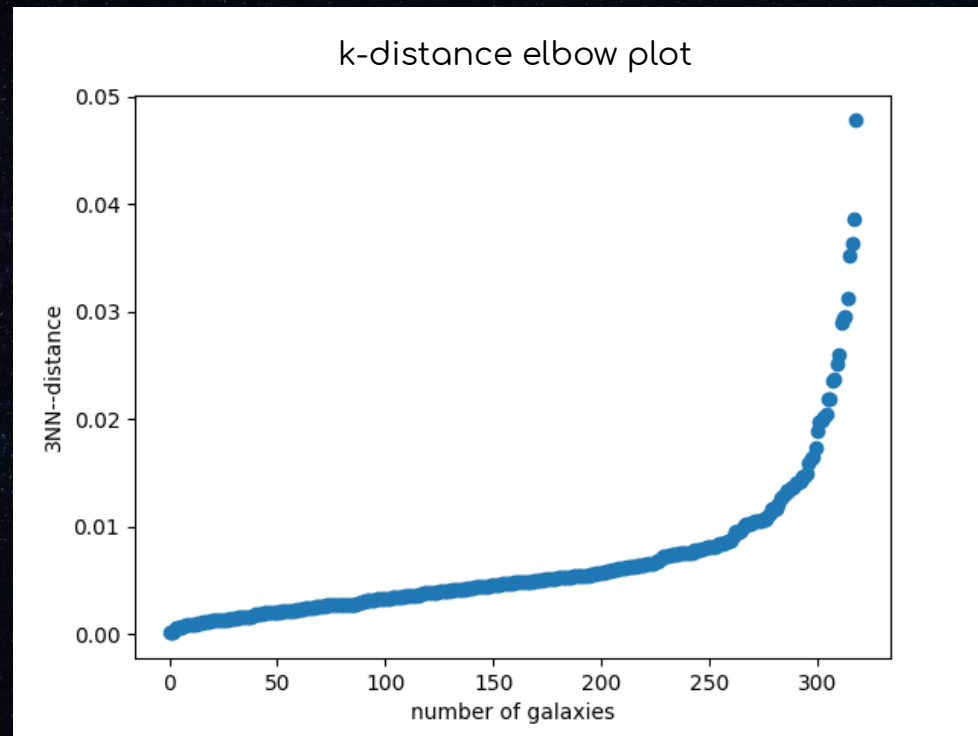
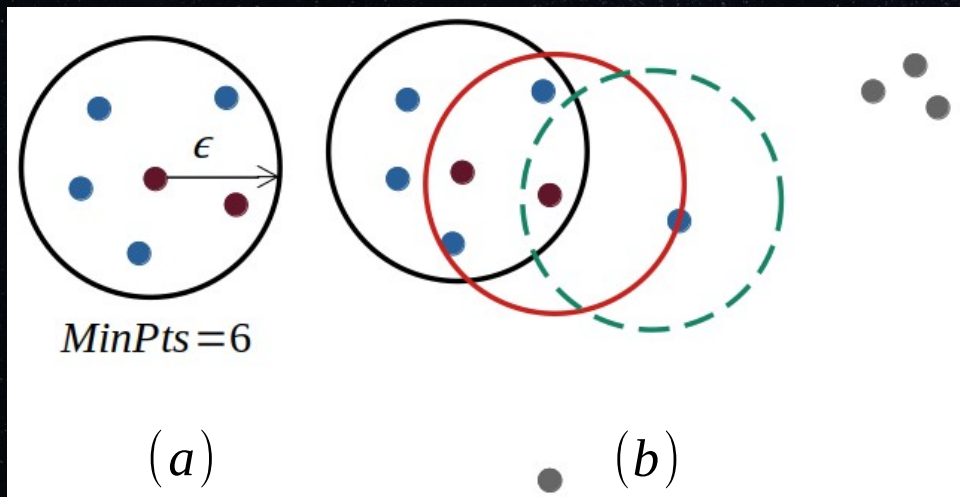
319 members + 16 subhalos

$$z \approx 0.34$$

$$\log(m_{200}/m_{\text{sun}}) \approx 14.89$$

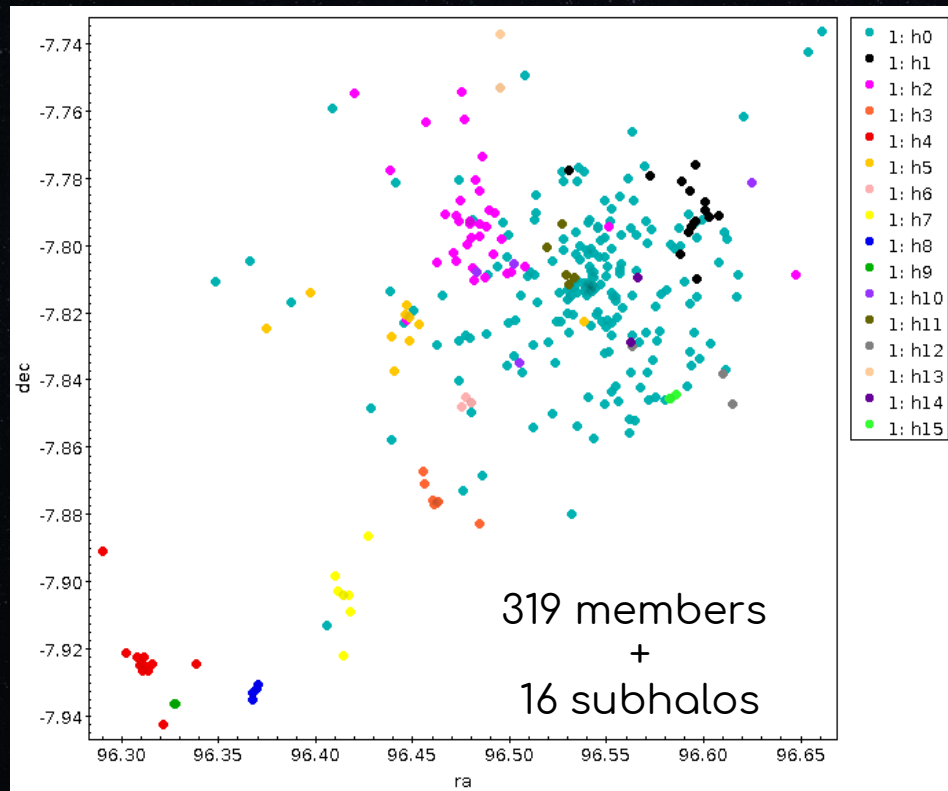
CALSAGOS ON S-PLUS MOCKS

DBSCAN

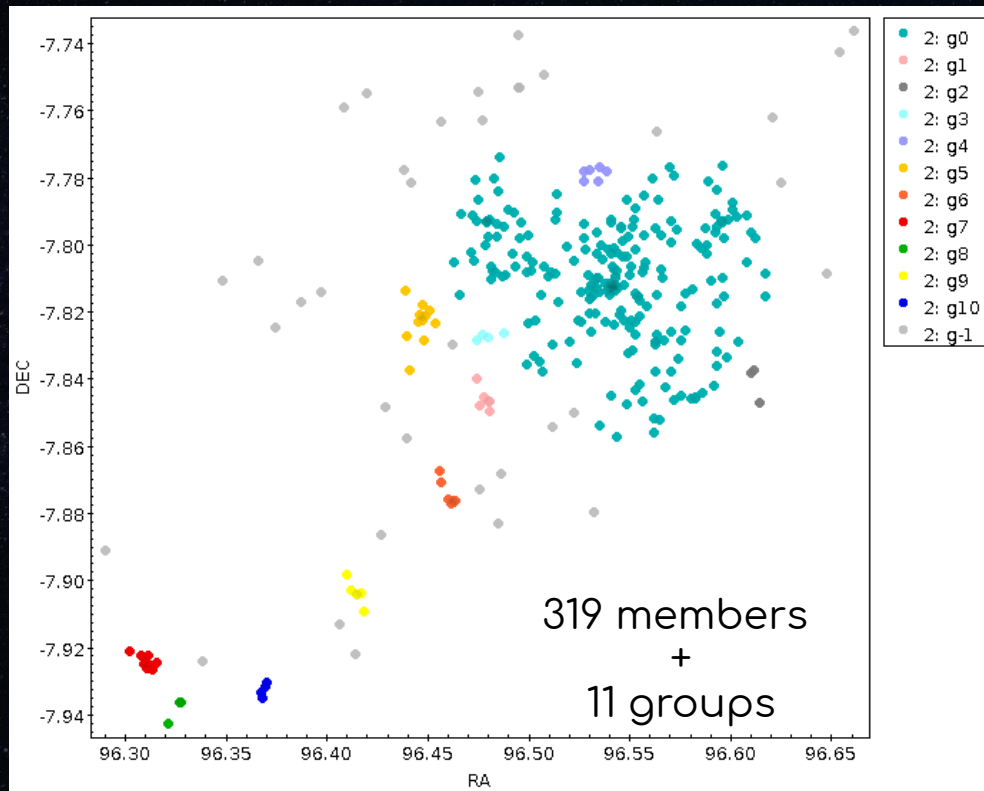


CALSAGOS ON S-PLUS MOCKS

Original halo + subhalos



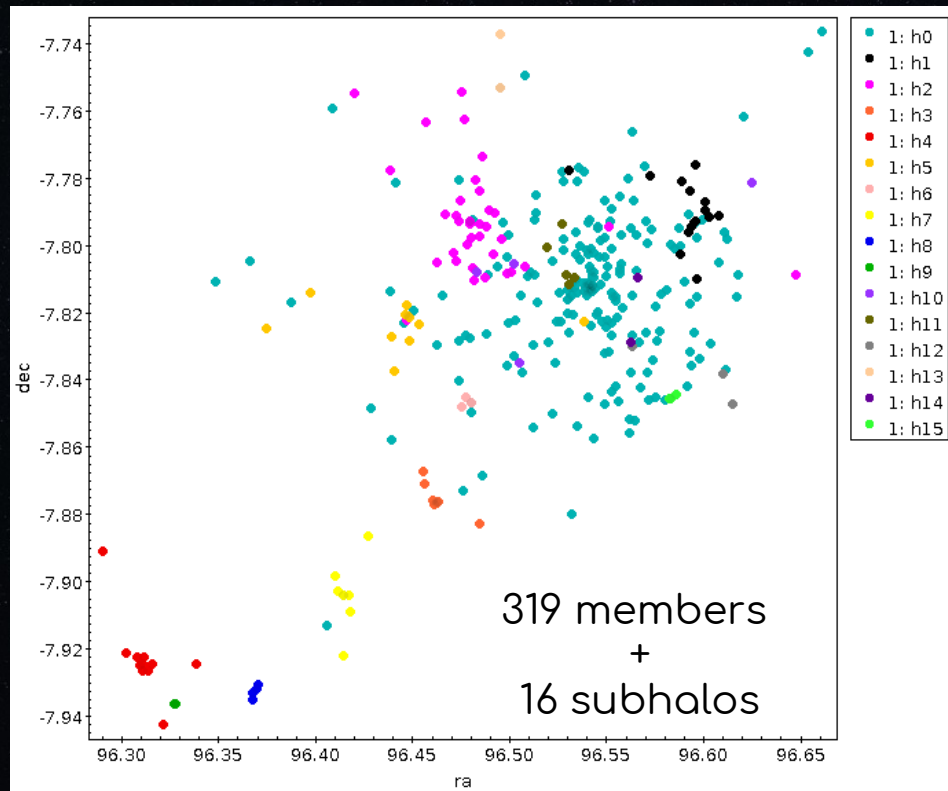
LAGASU application



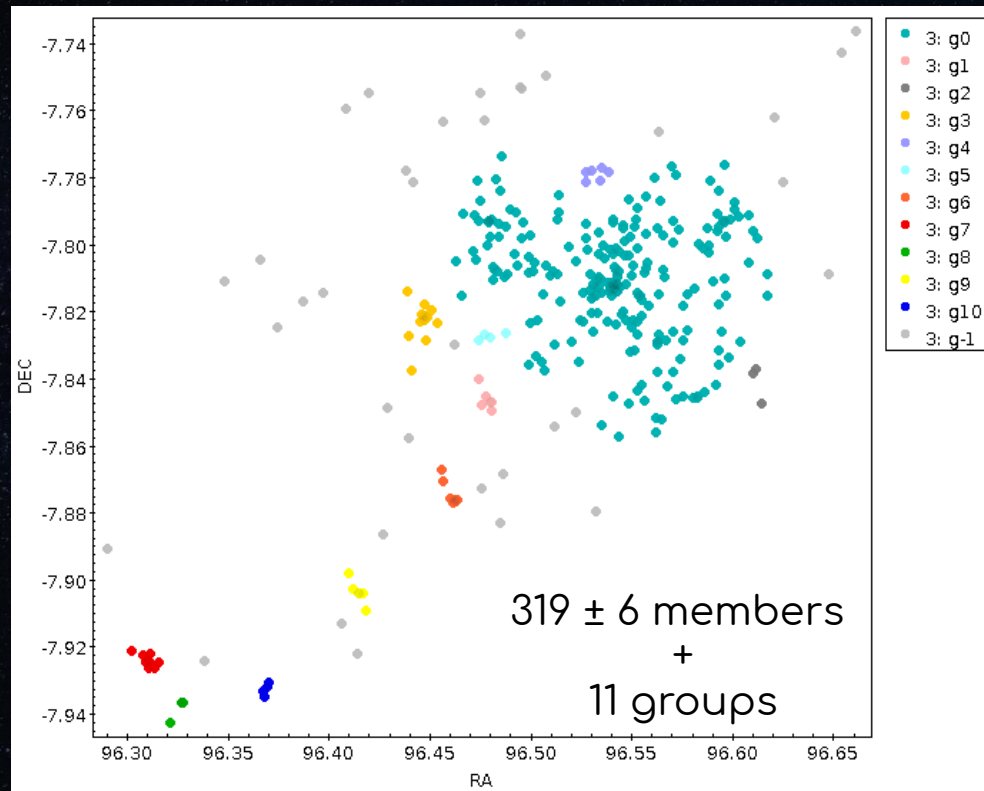
Olave-Rojas et al. in prep.

CALSAGOS ON S-PLUS MOCKS

Original halo + subhalos



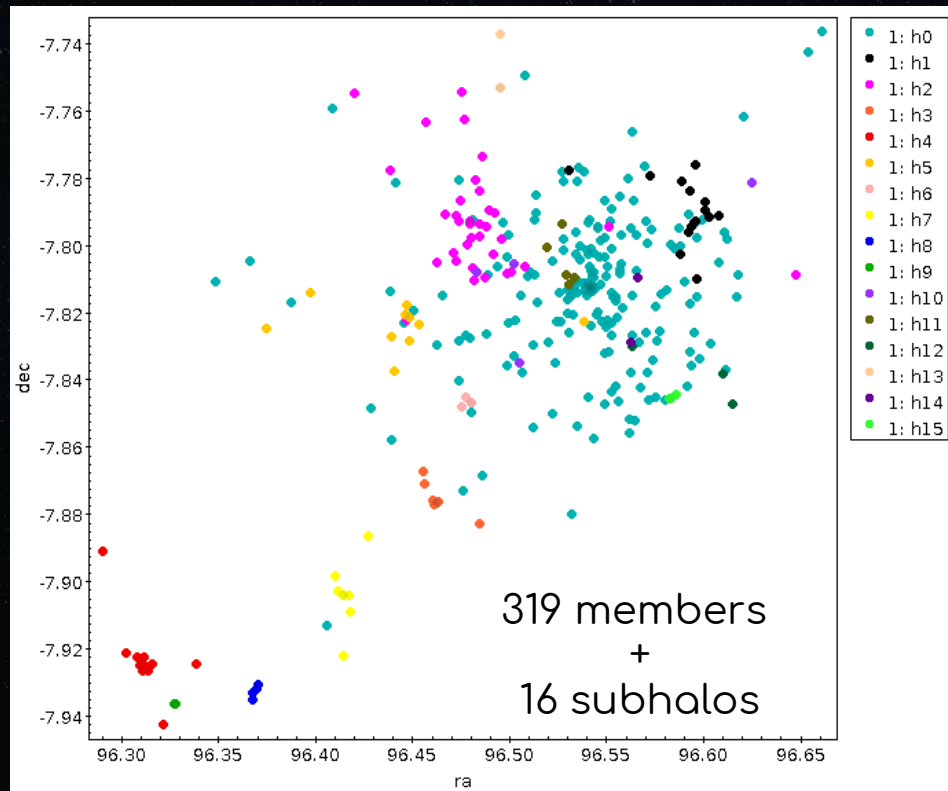
CLUMBERI + LAGASU application



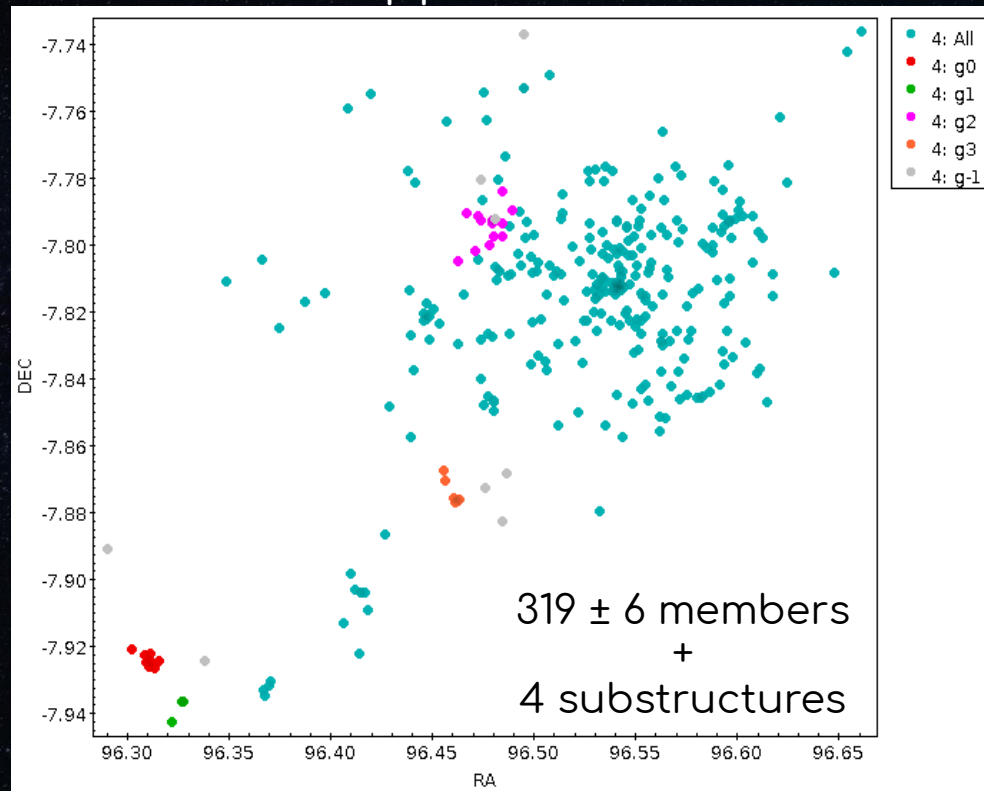
Olave-Rojas et al. in prep.

CALSAGOS ON S-PLUS MOCKS

Original halo + subhalos



CLUMBERI + DS-Test + LAGASU application



Olave-Rojas et al. in prep.

Important Results

- CLUMBERI has an uncertainty around 2% in selecting cluster members and can be used with photometric data
- In general, the substructures find by using DS-Test + LAGASU are real subhalos
- In general, LAGASU finds fewer groups than real subhalos and also finds some “artificial” groups

(a)

Future Works

- Quantify the accuracy of CALSAGOS to identify substructures and groups in and around galaxy clusters
- Publish the code
- Applied CALSAGOS to clusters in S-PLUS (pilot project A1644) to study the pre-processing of galaxies

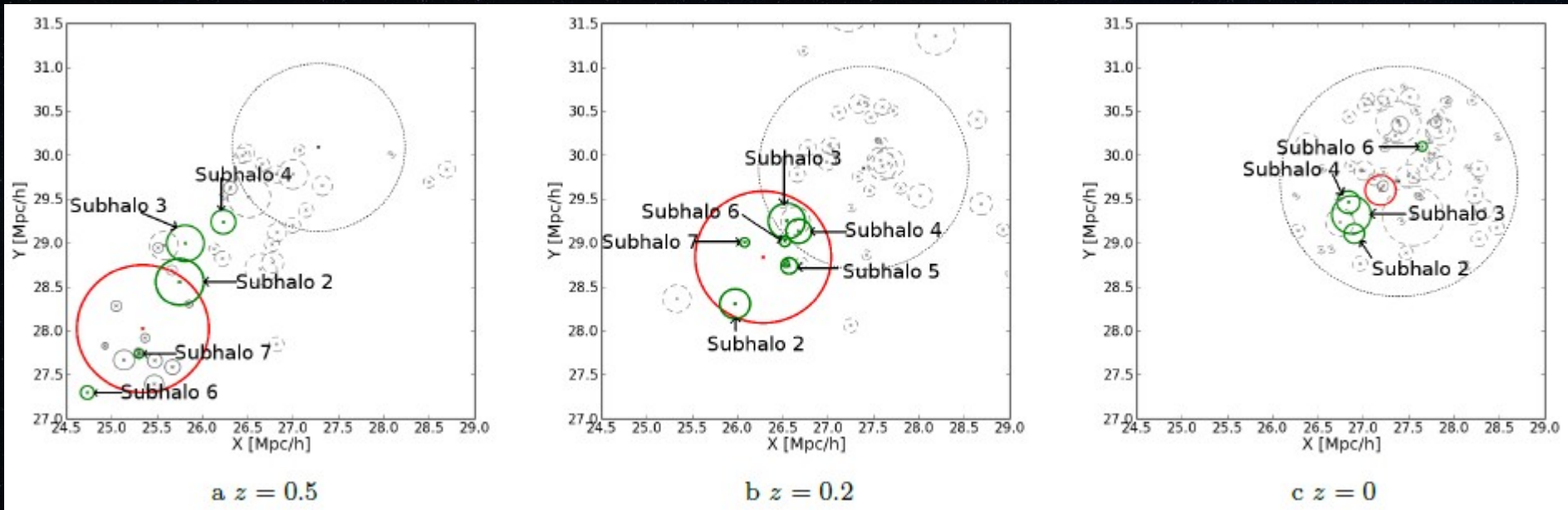
(a)



CALSAGOS: CLUSTERING ALGORITHMS APPLIED TO GALAXIES IN OVERDENSE SYSTEMS

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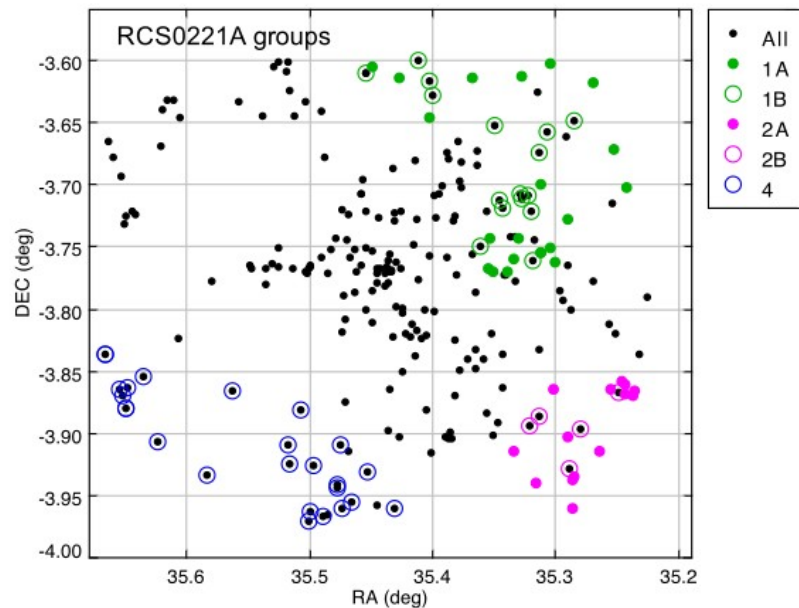
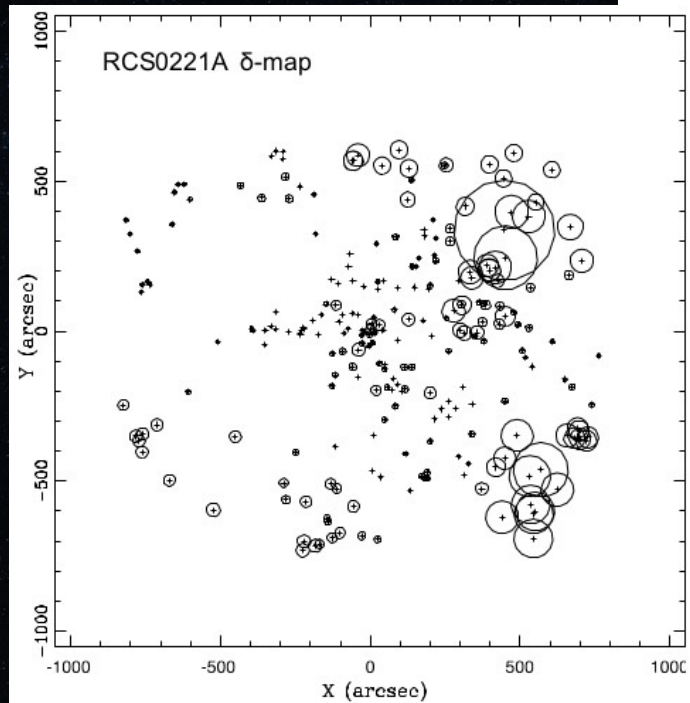
Detection of Substructures



Detection of Substructures

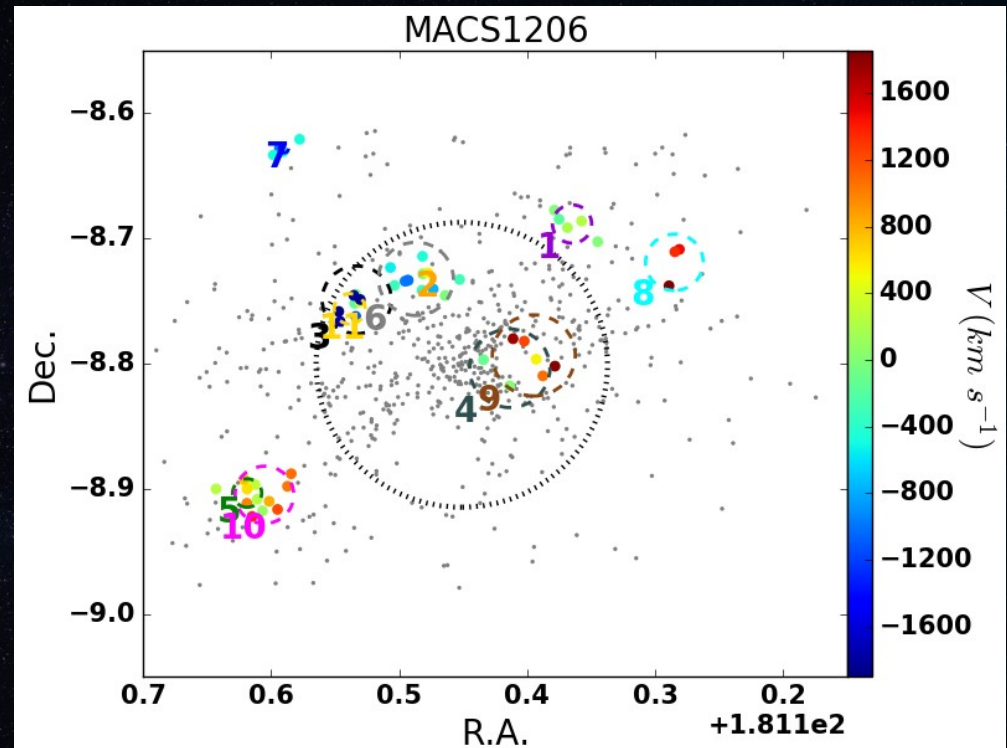
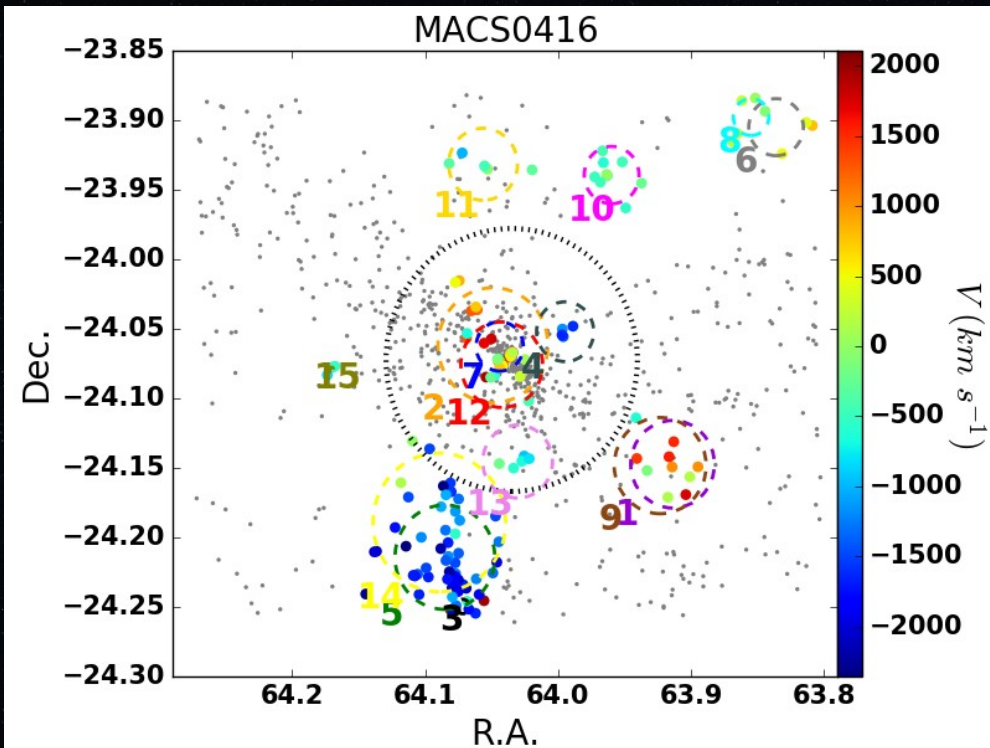
DS-Test (Dressler & Schectman 1988)

$$\delta_i^2 = \left(\frac{N_{nn} + 1}{\sigma_{cl}^2} \right) [(\bar{v}_{local}^i - \bar{v}_{cl})^2 + (\sigma_{local}^i - \sigma_{cl})^2]$$



Dressler et al. (2013)

Detection of Substructures



Olave-Rojas et al. (2018)

Dressler-Shectman Test
(Dressler & Shectman 1988)



GMM



DBSCAN (Ester et al. 1996)

S-PLUS MOCKS

Developed by Pablo Araya-Araya as part of S-PLUS collaboration (for details see Araya-Araya et al. 2021)

TOPCAT(5): Table Browser

Window Rows Help

Table Browser for 5: galaxies_subhalos_zphot_cat

| | galaxyid | haloid | RA | DEC | z_app | z_phot | firstHaloinFOF... | log(m_200) |
|----|----------|--------|----------|----------|---------|--------|-------------------|------------|
| 1 | 6938. | 16. | 93.60823 | -4.17524 | 0.43804 | -99. | 16. | 14.27986 |
| 2 | 14593. | 16. | 93.57603 | -4.16326 | 0.44123 | -99. | 16. | 14.27986 |
| 3 | 14471. | 16. | 93.58762 | -4.17509 | 0.44223 | -99. | 16. | 14.27986 |
| 4 | 14236. | 16. | 93.60789 | -4.14288 | 0.44256 | -99. | 16. | 14.27986 |
| 5 | 14199. | 16. | 93.60483 | -4.14508 | 0.44523 | -99. | 16. | 14.27986 |
| 6 | 14113. | 16. | 93.61955 | -4.17627 | 0.447 | -99. | 16. | 14.27986 |
| 7 | 13802. | 16. | 93.5917 | -4.17153 | 0.44407 | -99. | 16. | 14.27986 |
| 8 | 13411. | 16. | 93.59176 | -4.12663 | 0.44242 | -99. | 16. | 14.27986 |
| 9 | 12034. | 16. | 93.64742 | -4.14474 | 0.44212 | -99. | 16. | 14.27986 |
| 10 | 11993. | 16. | 93.62098 | -4.16399 | 0.44143 | -99. | 16. | 14.27986 |
| 11 | 11946. | 16. | 93.61327 | -4.17577 | 0.44362 | -99. | 16. | 14.27986 |
| 12 | 9676. | 16. | 93.58949 | -4.17081 | 0.44071 | -99. | 16. | 14.27986 |
| 13 | 9647. | 16. | 93.61121 | -4.15999 | 0.44606 | -99. | 16. | 14.27986 |
| 14 | 9219. | 16. | 93.62399 | -4.16643 | 0.44281 | -99. | 16. | 14.27986 |
| 15 | 9186. | 16. | 93.59956 | -4.16499 | 0.44118 | -99. | 16. | 14.27986 |
| 16 | 9151. | 16. | 93.57858 | -4.16624 | 0.43984 | -99. | 16. | 14.27986 |
| 17 | 7797. | 16. | 93.61646 | -4.19561 | 0.44345 | -99. | 16. | 14.27986 |
| 18 | 7700. | 16. | 93.61758 | -4.17471 | 0.44378 | -99. | 16. | 14.27986 |
| 19 | 7445. | 16. | 93.57937 | -4.1727 | 0.44422 | -99. | 16. | 14.27986 |

Total: 419,404 Visible: 419,404 Selected: 0

TOPCAT(3): Table Browser

Window Rows Help

Table Browser for 3: subhalos_mock_cat

| | haloid | firstHaloinFOFGro... | snapn... | m_crit200 | np |
|----|--------|----------------------|----------|-----------|-----|
| 1 | 4021 | 16 | 47 | 2.49796 | 20 |
| 2 | 4359 | 16 | 47 | 4.70823 | 27 |
| 3 | 4712 | 16 | 47 | 0. | 20 |
| 4 | 6394 | 16 | 47 | 2.59386 | 24 |
| 5 | 6981 | 16 | 47 | 49.39023 | 149 |
| 6 | 8710 | 16 | 47 | 23.25606 | 34 |
| 7 | 9614 | 16 | 47 | 9.51124 | 62 |
| 8 | 10585 | 16 | 47 | 8.16836 | 38 |
| 9 | 13191 | 16 | 47 | 3.17026 | 35 |
| 10 | 14172 | 16 | 47 | 13.35581 | 97 |
| 11 | 21072 | 16 | 47 | 10.18374 | 101 |
| 12 | 22291 | 16 | 47 | 41.89029 | 327 |
| 13 | 23568 | 16 | 47 | 46.01419 | 378 |
| 14 | 26618 | 16 | 47 | 49.18804 | 235 |
| 15 | 27680 | 16 | 47 | 6.72517 | 39 |
| 16 | 33432 | 16 | 47 | 8.64661 | 57 |
| 17 | 39815 | 16 | 47 | 3.07441 | 28 |
| 18 | 4049 | 16 | 47 | 0. | 20 |
| 19 | 4405 | 16 | 47 | 2.97852 | 22 |

Total: 262,028 Visible: 262,028 Selected: 1

S-PLUS MOCKS

Mocks - Google Drive







drive.google.com/drive/folders/11IBOUS_kYixQJT4MrtUS6-6Rjp7or1C4

Apps Gmail Translate Funcionarios EDUCANDUS Outlook Web Cisco Webex Microsoft Offi... NASA/ADS Reading list

Drive

Buscar en Drive

Compartido conmigo > S-PLUS Galaxy Environment WG > Mocks

| Nombre ↑ | Propietario | Última modificación | Tamaño de archivo |
|---|-------------|---------------------|-------------------|
|  galaxies_subhalos_...  | yo | 14:07 yo | 156,3 MB |
|  galaxies_subhalos_...  | yo | 14:10 yo | 153,4 MB |
|  subhalos_mock.cat  | yo | 14:13 yo | 13,9 MB |

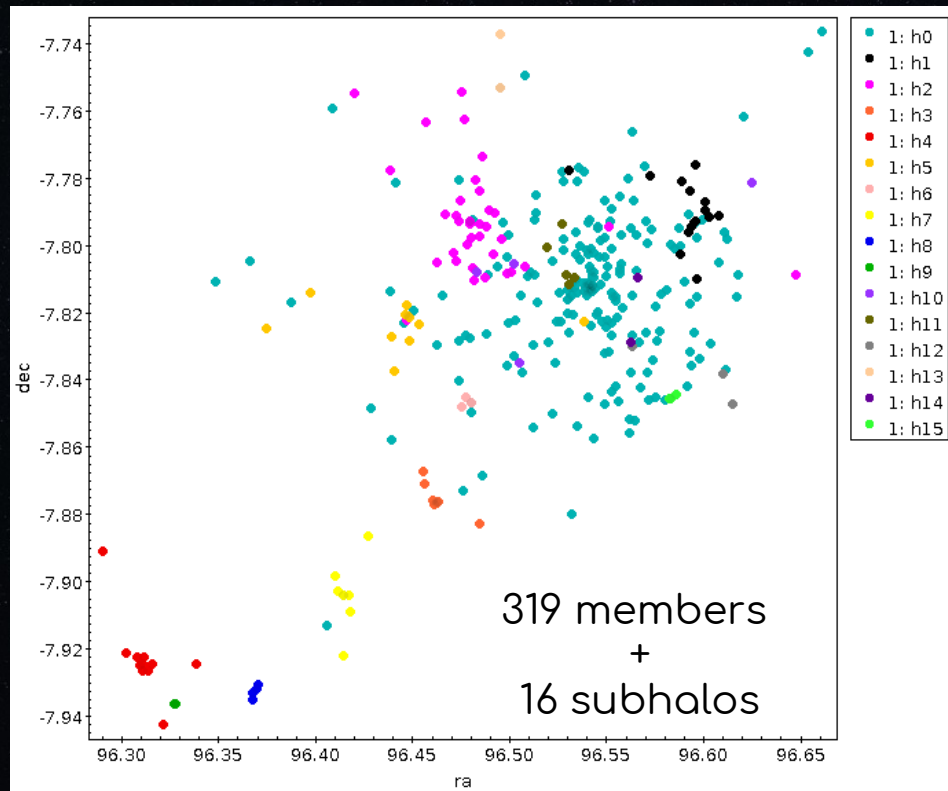
Nuevo

- MI unidad
- Ordenadores
- Compartido conmigo
- Reciente
- Destacados
- Papelera

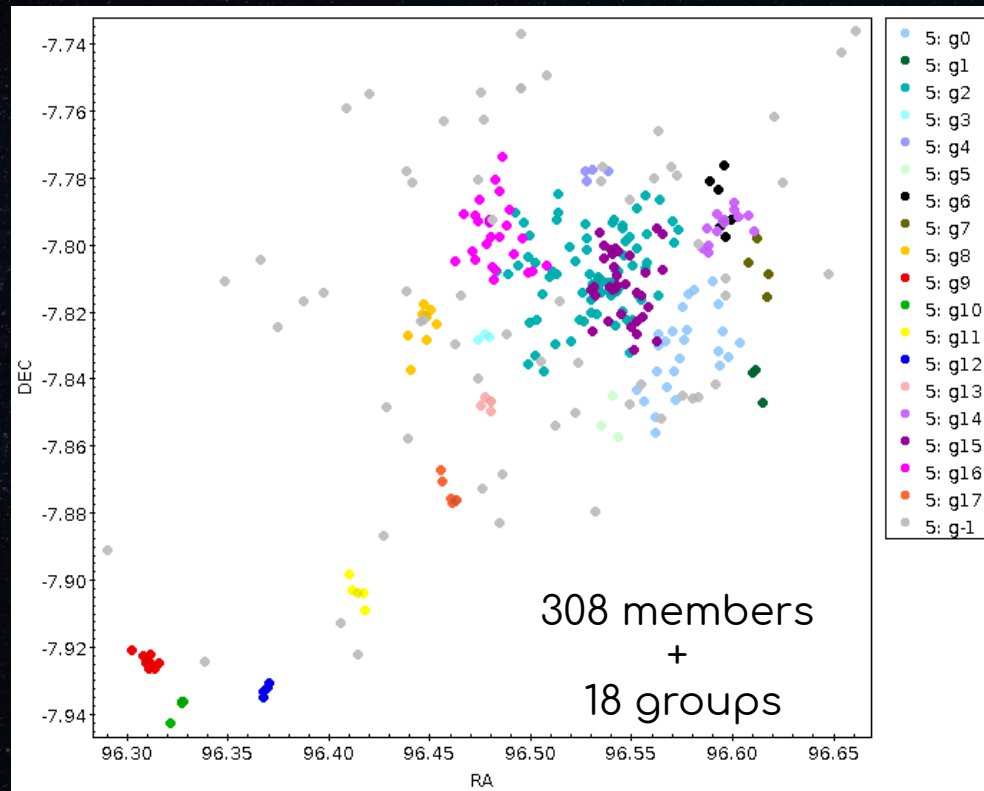
Calendar, Tasks, Photos, Drive, Home, Search, +

CALSAGOS ON S-PLUS MOCKS

Original halo + subhalos



ISOMER + LAGASU application

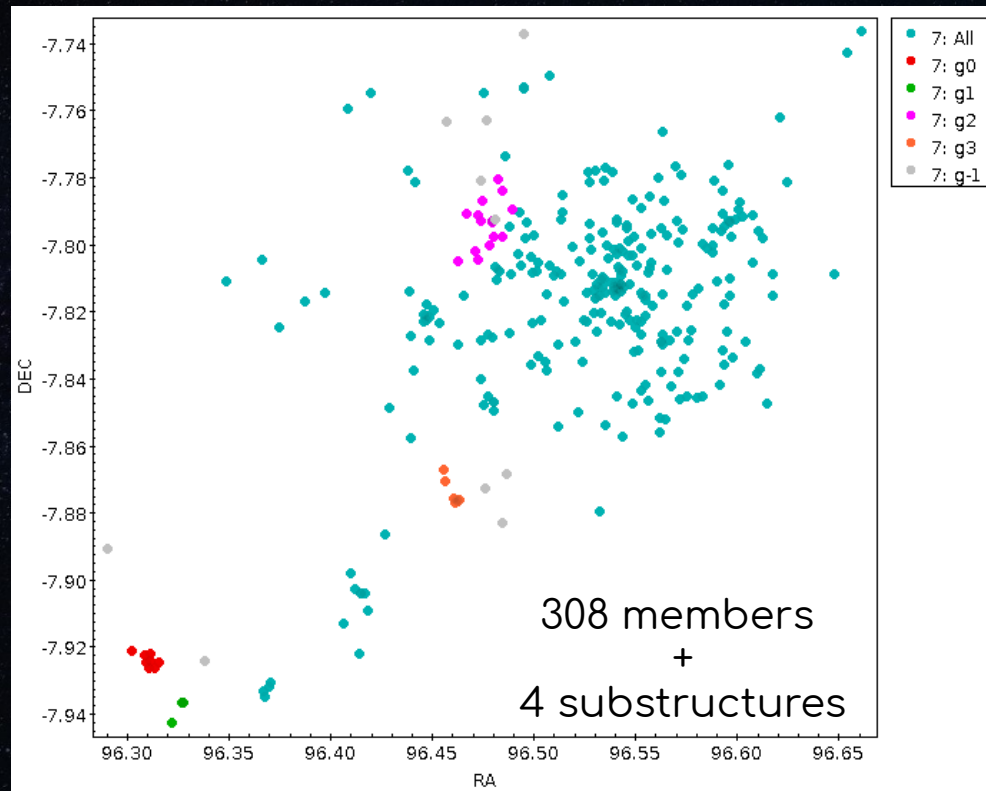
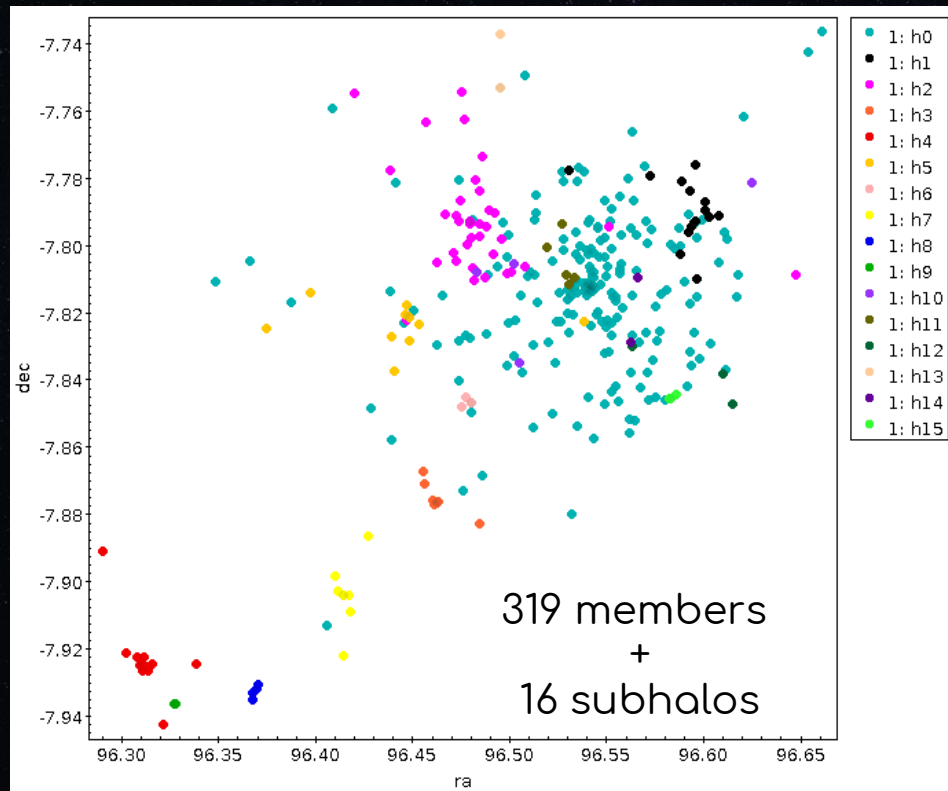


Olave-Rojas et al. in prep.

CALSAGOS ON S-PLUS MOCKS

Original halo + subhalos

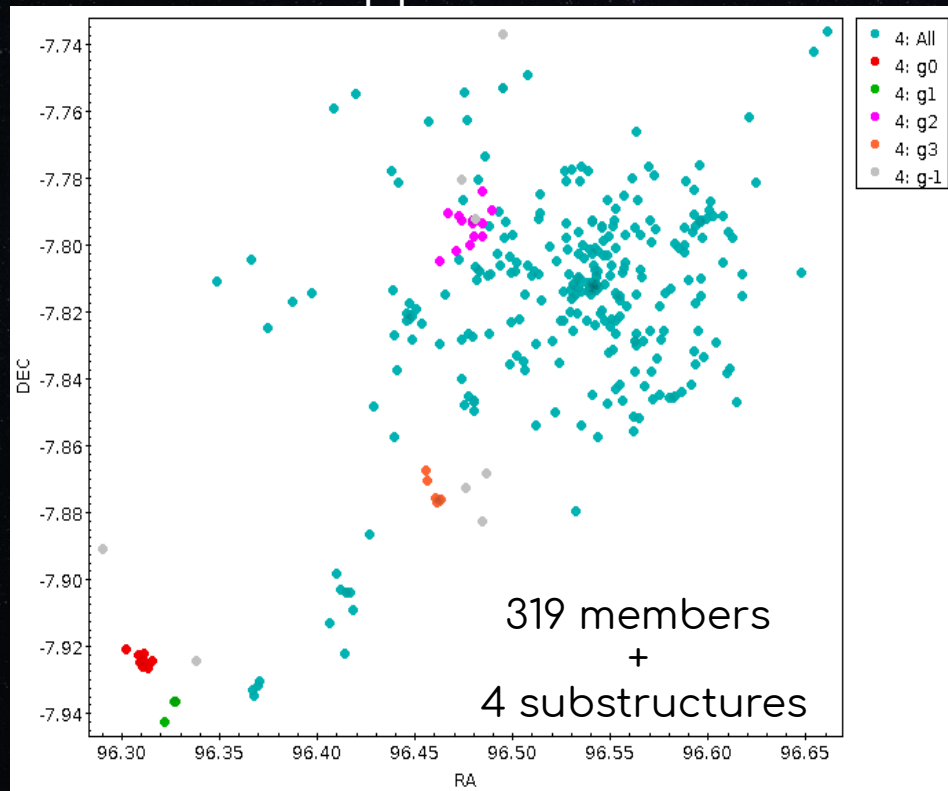
ISOMER + DS-Test + LAGASU application



Olave-Rojas et al. in prep.

CALSAGOS ON S-PLUS MOCKS

CLUMBERI + DS-Test + LAGASU
application



ISOMER + DS-Test + LAGASU
application

