

*+ observational detection  
of assembly bias*

# time invariance of total stellar mass–cluster mass relation

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Yen-Ting Lin  
Institute of Astronomy and Astrophysics  
Academia Sinica

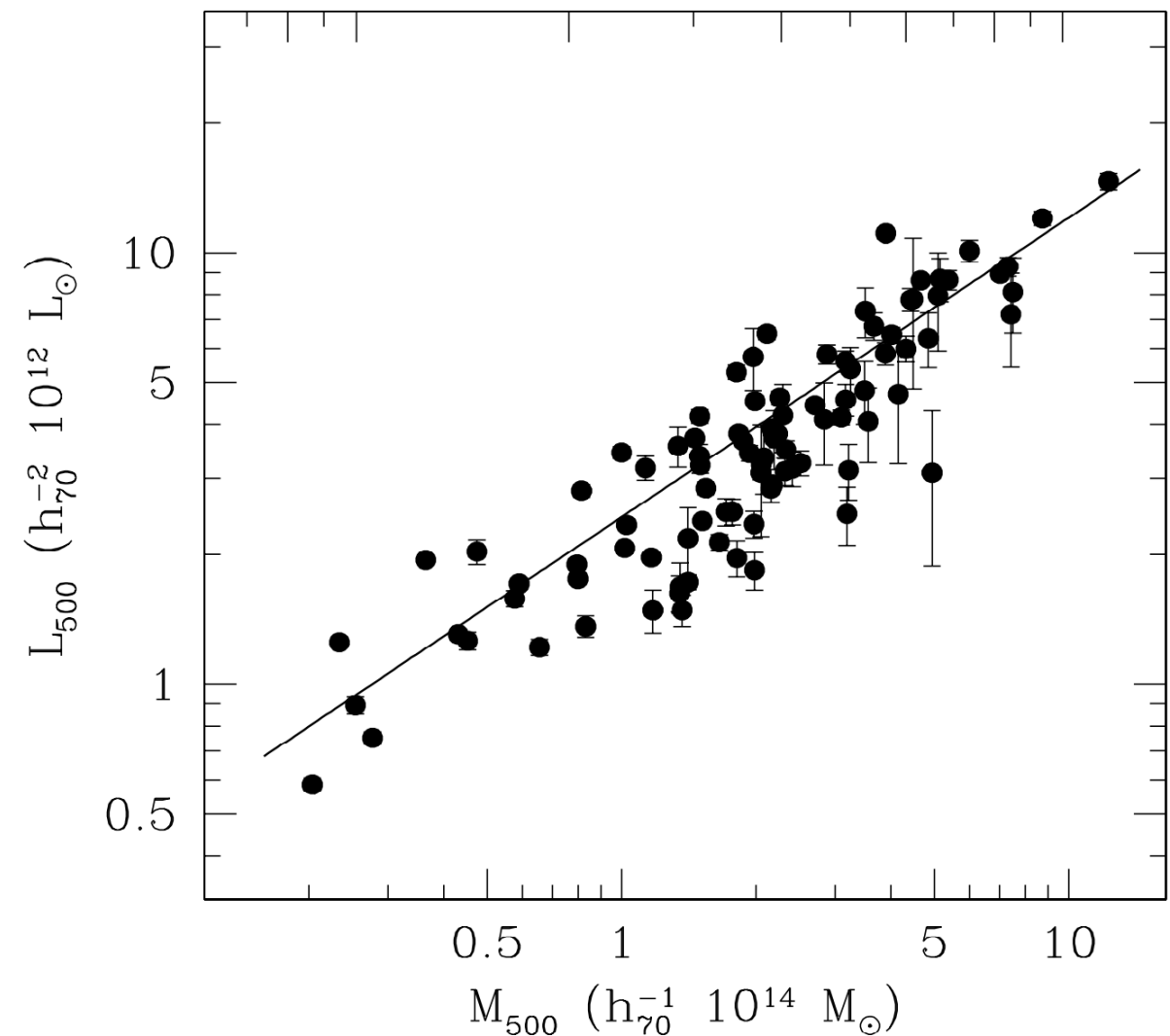
with  
Bau-Ching Hsieh, Masamune Oguri, and the HSC collaboration  
and  
Hironao Miyatake, Hong Guo, Huiyuan Wang, Xiaohu Yang, Rachel Mandelbaum,  
Benedikt Diemer, Andrey Kravtsov, and Neal Dalal

total stellar mass–cluster mass relation

# total near-IR K-band light

## total stellar mass–cluster mass correlation

- the scaling is far from linear!
- clusters are *not* self-similar — you don't build massive clusters simply by combining smaller ones together
- total galaxy stellar mass per unit halo mass has to decrease as clusters become more massive
  - tidal stripping  $\Rightarrow$  intracluster light?!



$$\frac{L_{200}}{10^{12} h_{70}^{-2} L_{\odot}} = 5.64 \pm 0.16 \left( \frac{M_{200}}{2.7 \times 10^{14} h_{70}^{-1} M_{\odot}} \right)^{0.72 \pm 0.04}$$

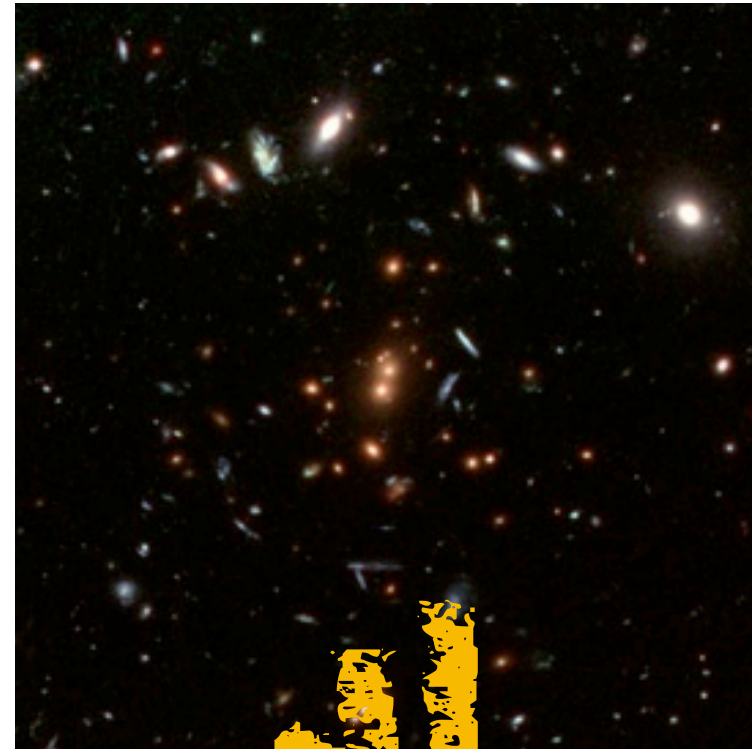
$$\begin{aligned} L_{200} &\propto M_{200}^{0.7} \\ (L/M) &\propto M^{-0.3} \end{aligned}$$



# total near-IR K-band light

## total stellar mass–cluster mass correlation

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- clusters are *not* self-similar — you don't build massive clusters simply by combining smaller ones together
- total galaxy stellar mass per unit halo mass has to decrease as clusters become more massive
  - tidal stripping  $\Rightarrow$  intracluster light?!
  - perhaps the progenitors of  $z \sim 0$  high-mass clusters (=lower mass clusters at high- $z$ ) are different (in terms of  $L/M$ ) from the low- $z$  low-mass ones?
    - change in the scaling relation may be expected...
    - varying galaxy formation efficiency as a function of cluster mass??



RDCS1252

$z=1.24$

$M_{200} \sim 3 \times 10^{14} M_{\text{sun}}$



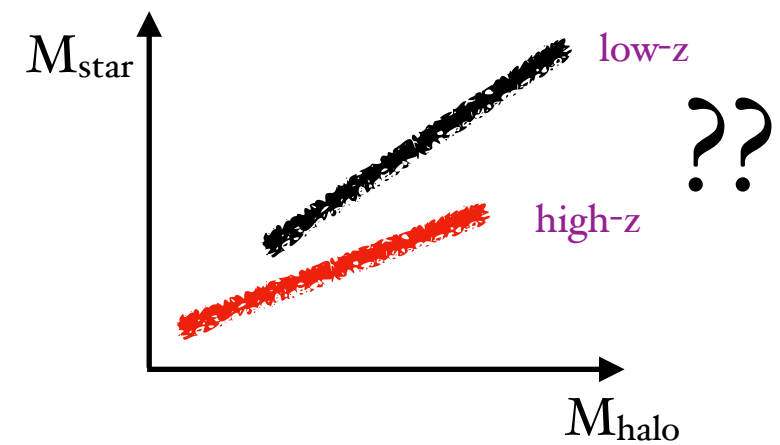
Abell2107

$z=0.041$

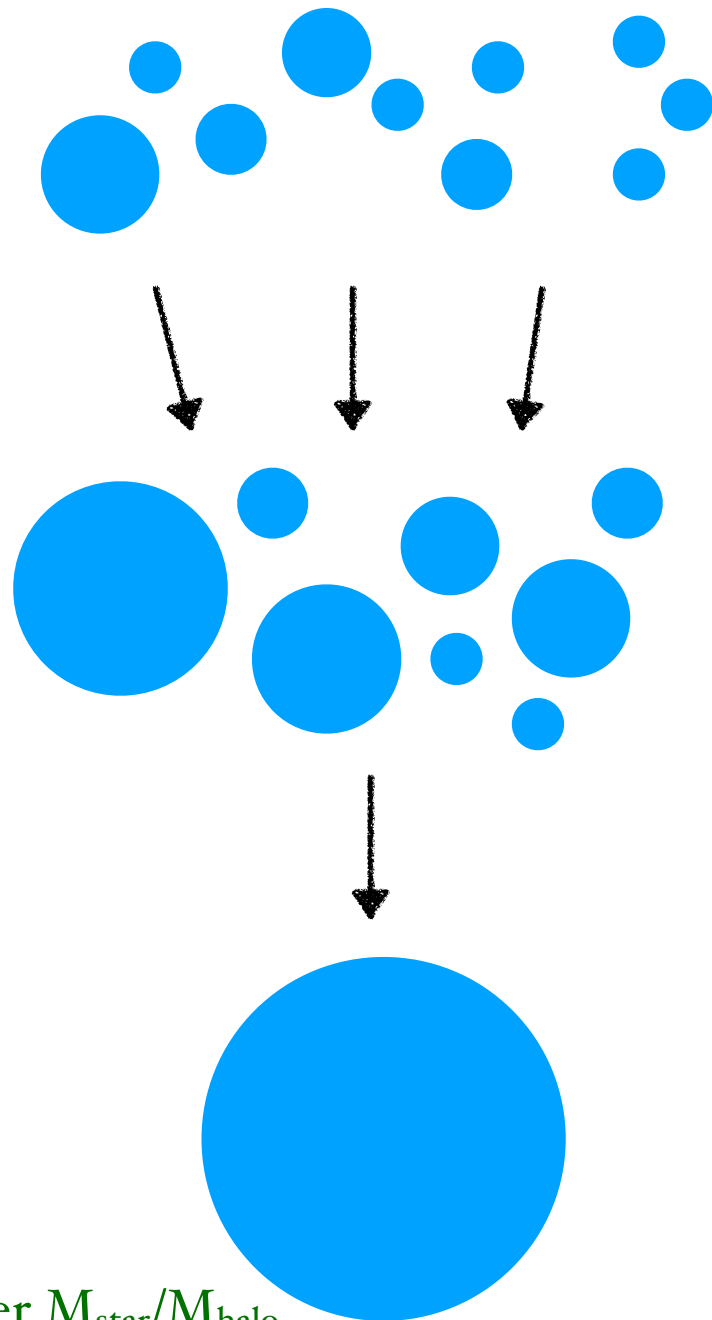
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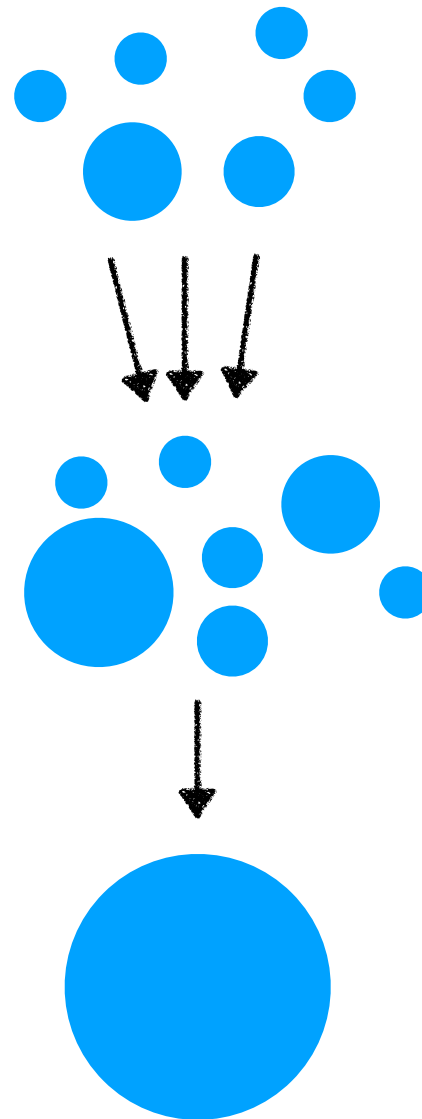
- change in the scaling relation may be expected...
- varying galaxy formation efficiency as a function of cluster mass?? somehow halos must know where/what will they end up with?



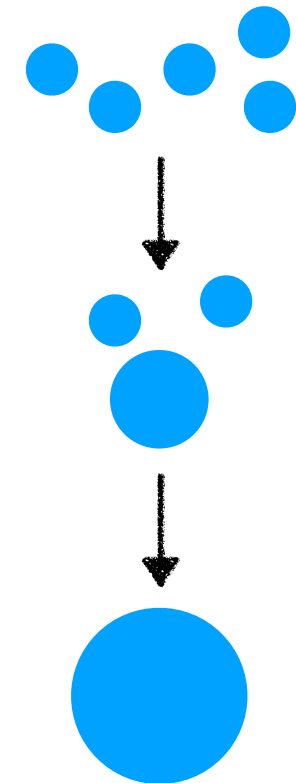
smaller  $M_{\text{star}}/M_{\text{halo}}????$



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larger  $M_{\text{star}}/M_{\text{halo}}????$

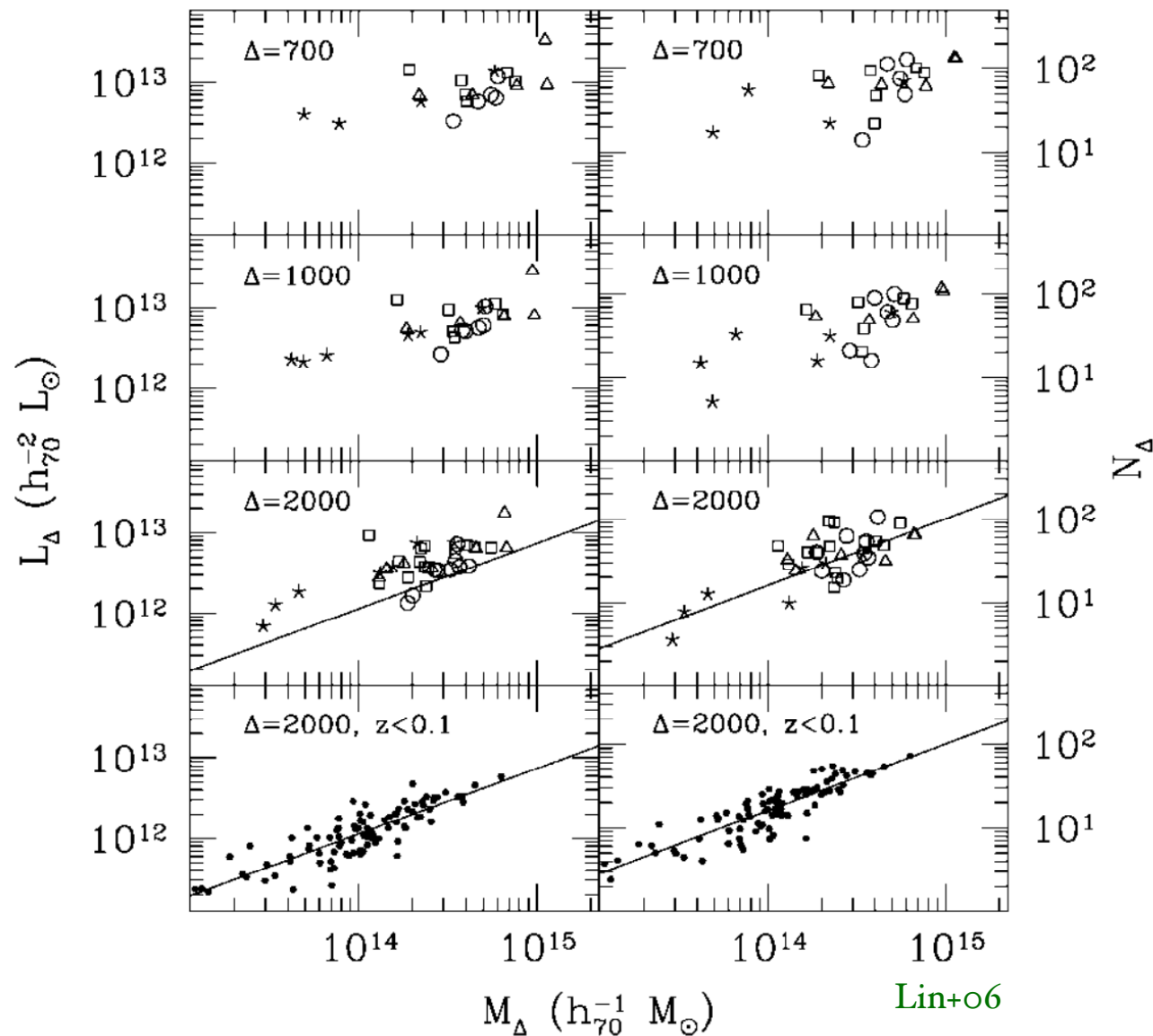


larger  $M_{\text{star}}/M_{\text{halo}}$

time

# does the relation evolve?

27 clusters,  $z=0-0.9$

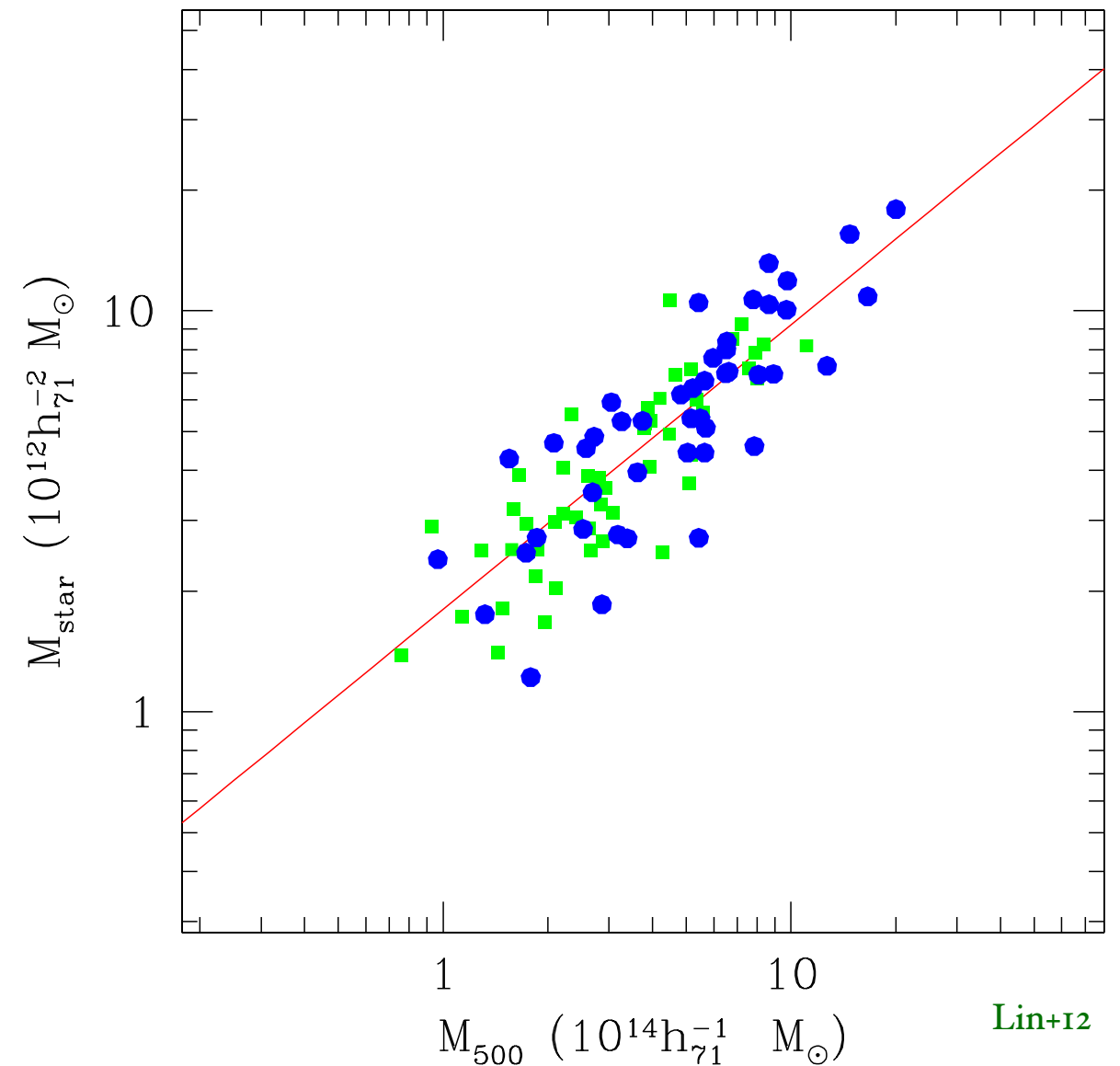


$$N(M, z) = N_0(1+z)^\gamma(M/M_0)^s$$

$$\gamma = -0.03 \pm 0.27$$

scaling with near-IR L similar once  
passive evolution has been taken into account

94 clusters,  $z=0-0.6$

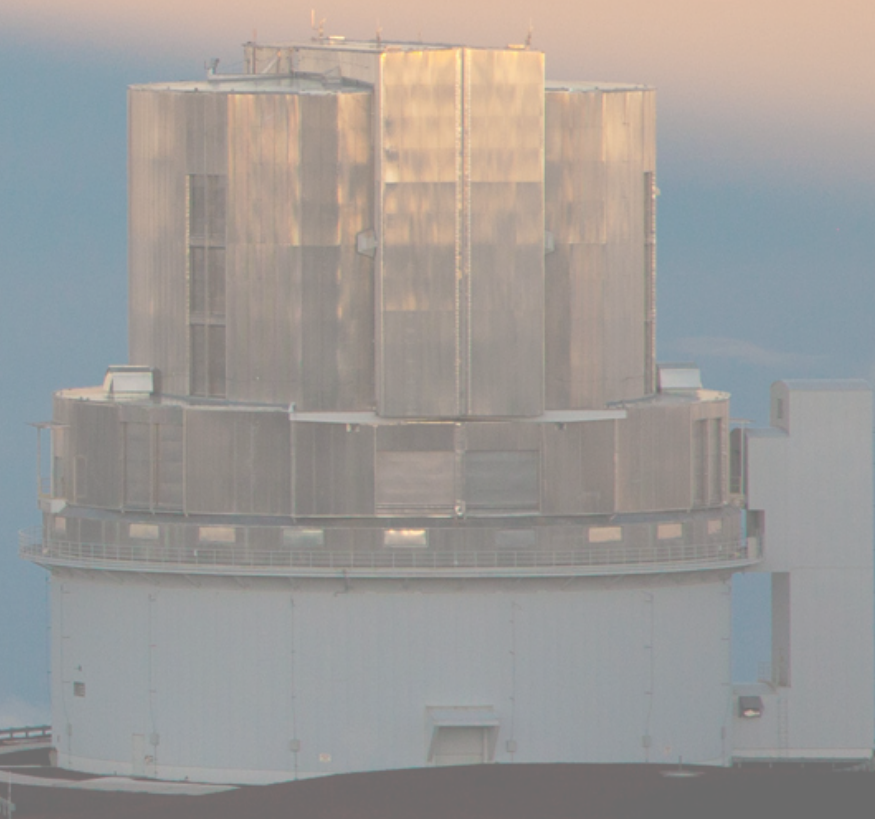


$$M_{\text{star}} \propto M_{500}^{s_2}(1+z)^{\gamma_2}$$

$$s_2 = 0.71 \pm 0.04$$

$$\gamma_2 = -0.06 \pm 0.22$$

insights from the HSC survey

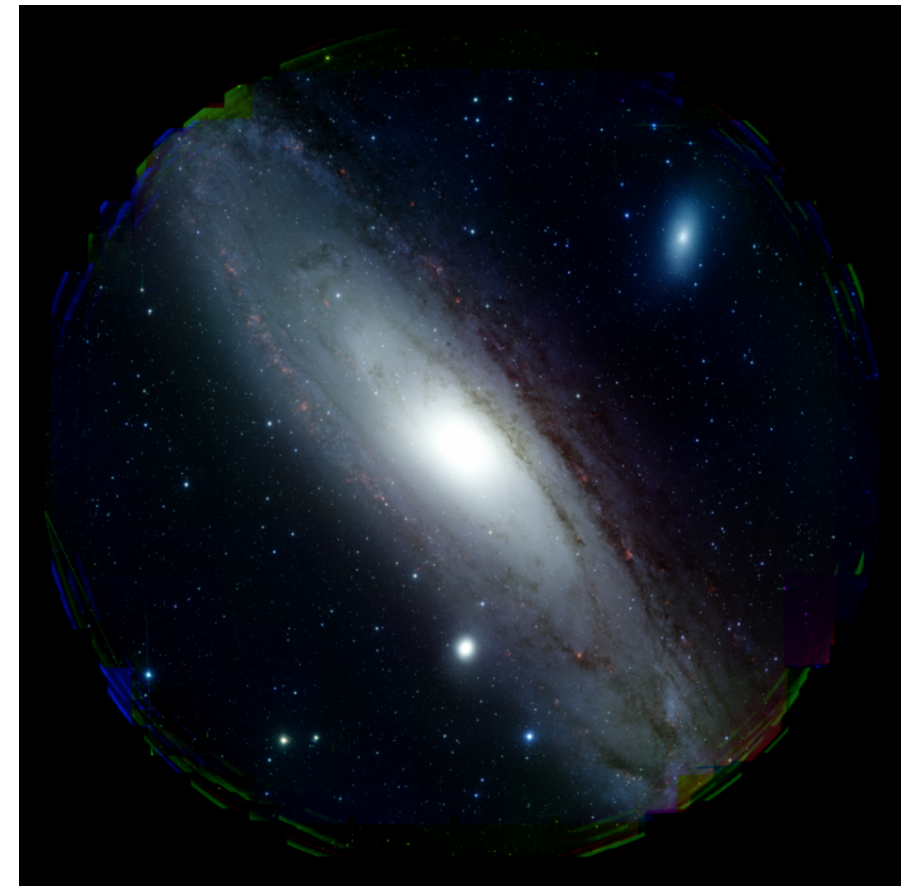




# the HSC survey

- not just yet another imaging survey
  - superb imaging quality (median seeing 0.6")
  - narrow-band filters in deep+ultradeep layers
- complete census of clusters at key phases
  - proto-clusters as Lyman break galaxy overdensities at  $z=4-6$
  - clusters at  $z=1-2$  from broad & narrow bands
  - $z<1$  clusters from red sequence or shear selection
- 1st public data release in 02/2017; 2nd in mid-2019

Layer	Area [deg <sup>2</sup> ]	Number of pointings	Filters and depth
Wide	1400	916	<i>grizy</i> ( $i \simeq 26$ )
Deep	26	15	<i>grizy</i> + 3NBs ( $i \simeq 27$ )
UltraDeep	3.5	2	<i>grizy</i> + 3NBs ( $i \simeq 28$ )

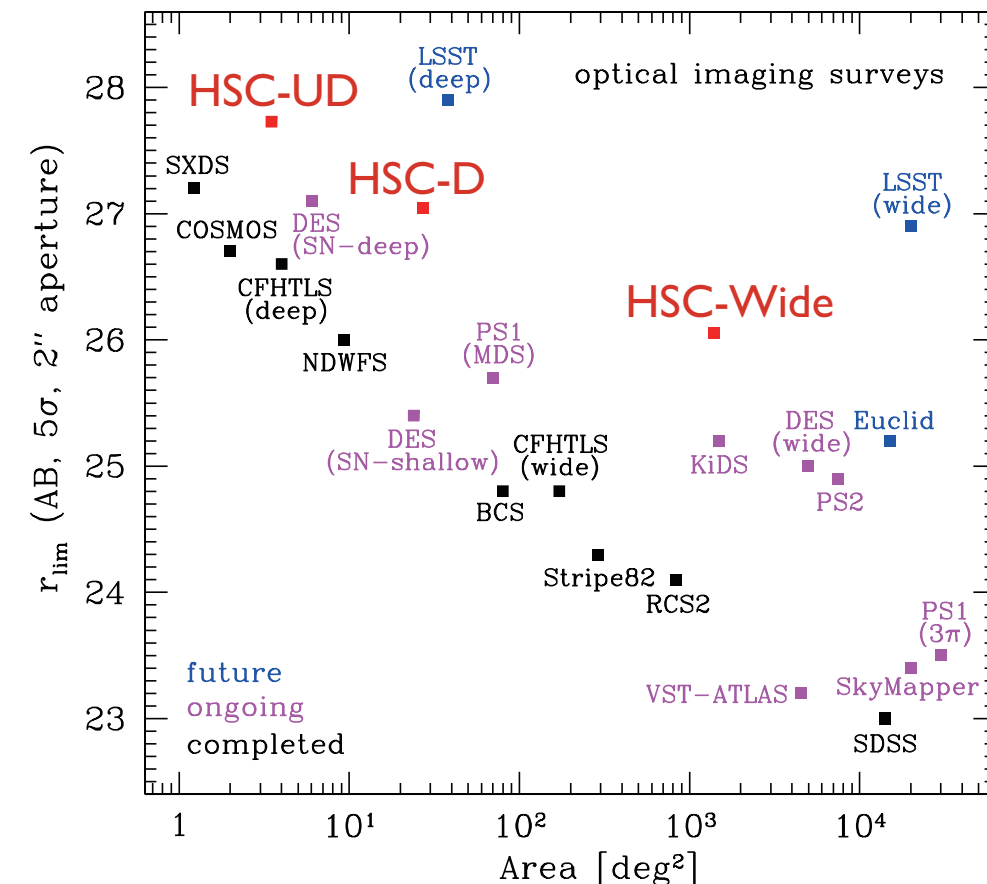


credit: M. Tanaka, K. Wong, K. Thanjavur



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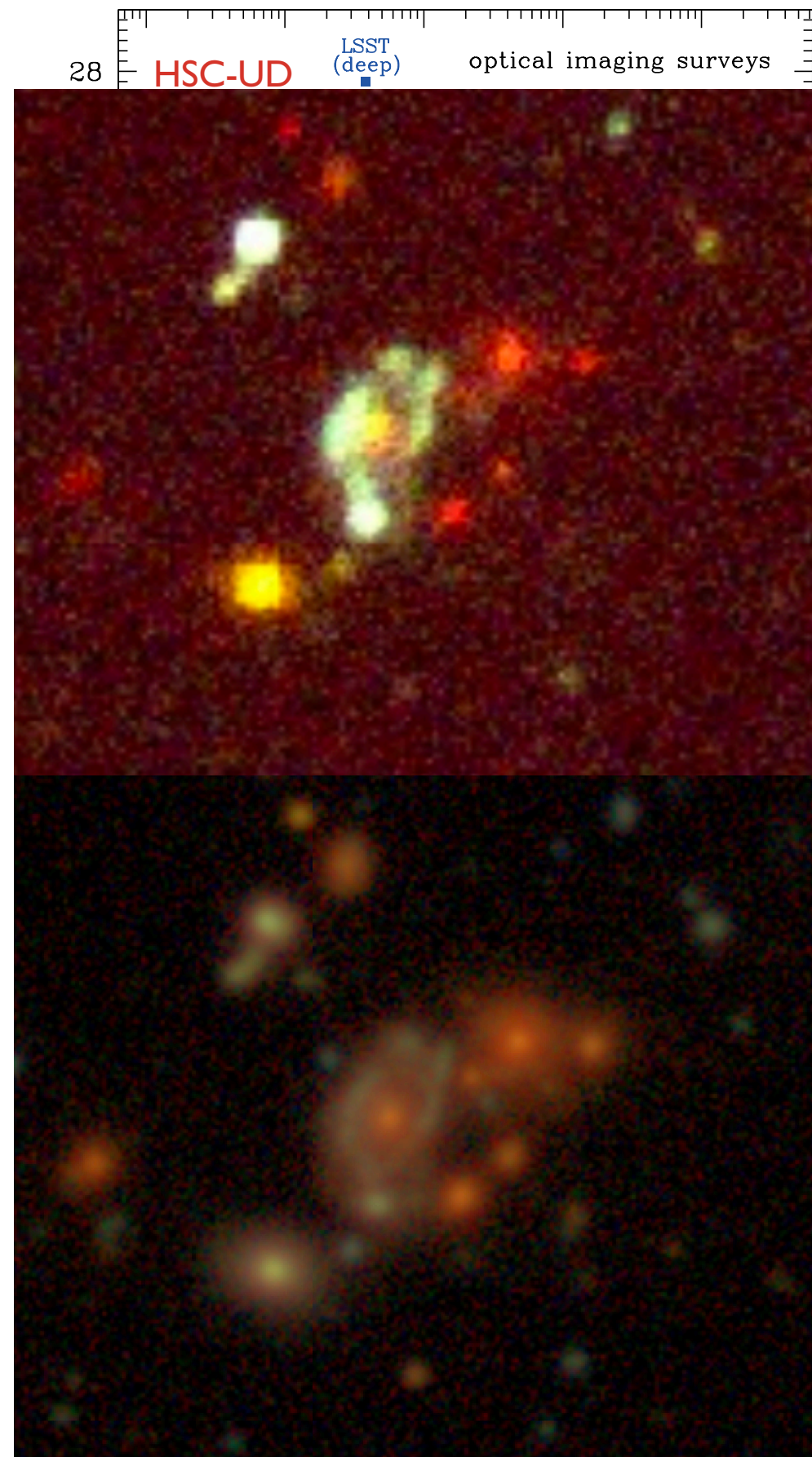
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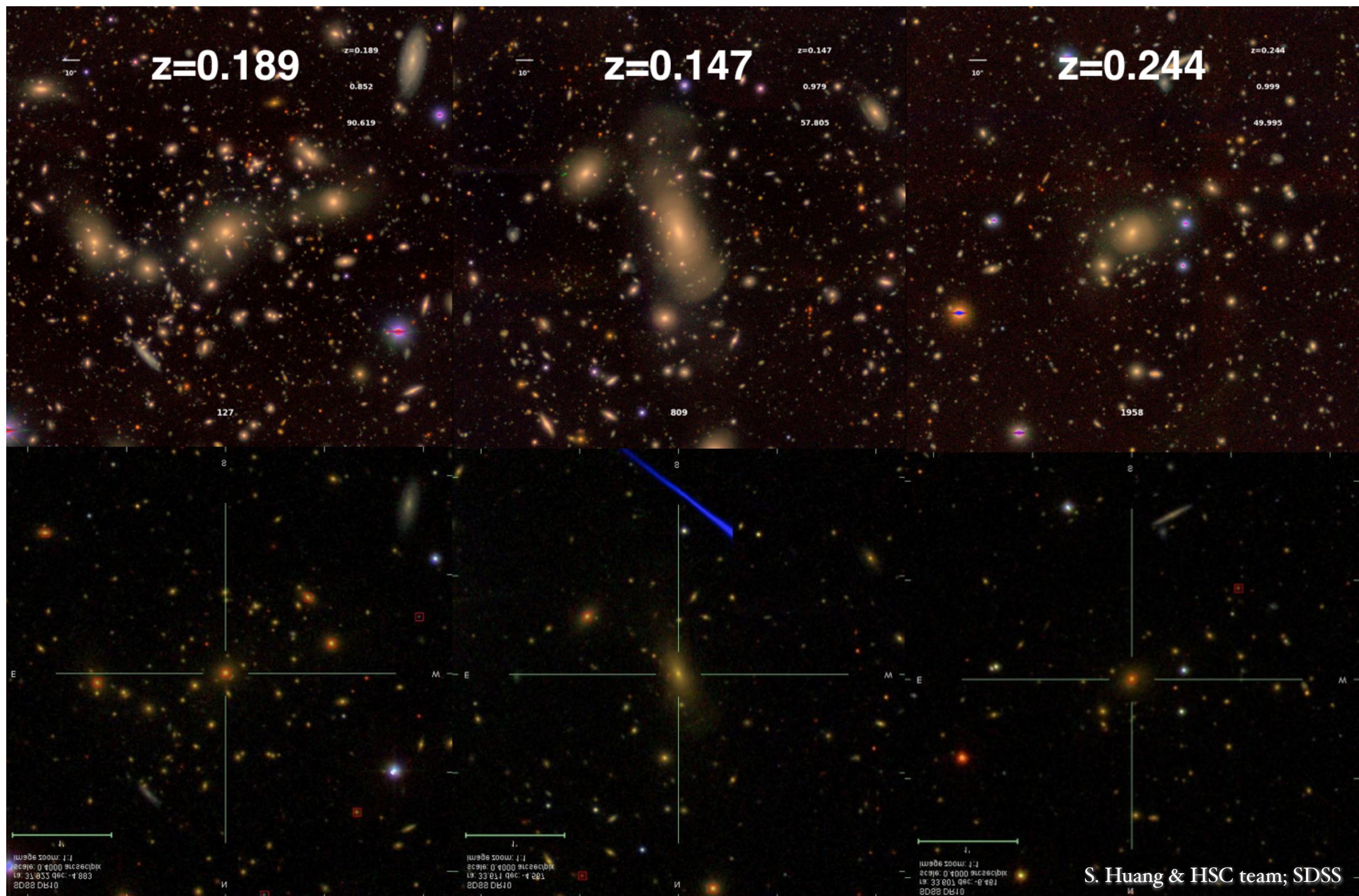
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# the HSC cluster sample

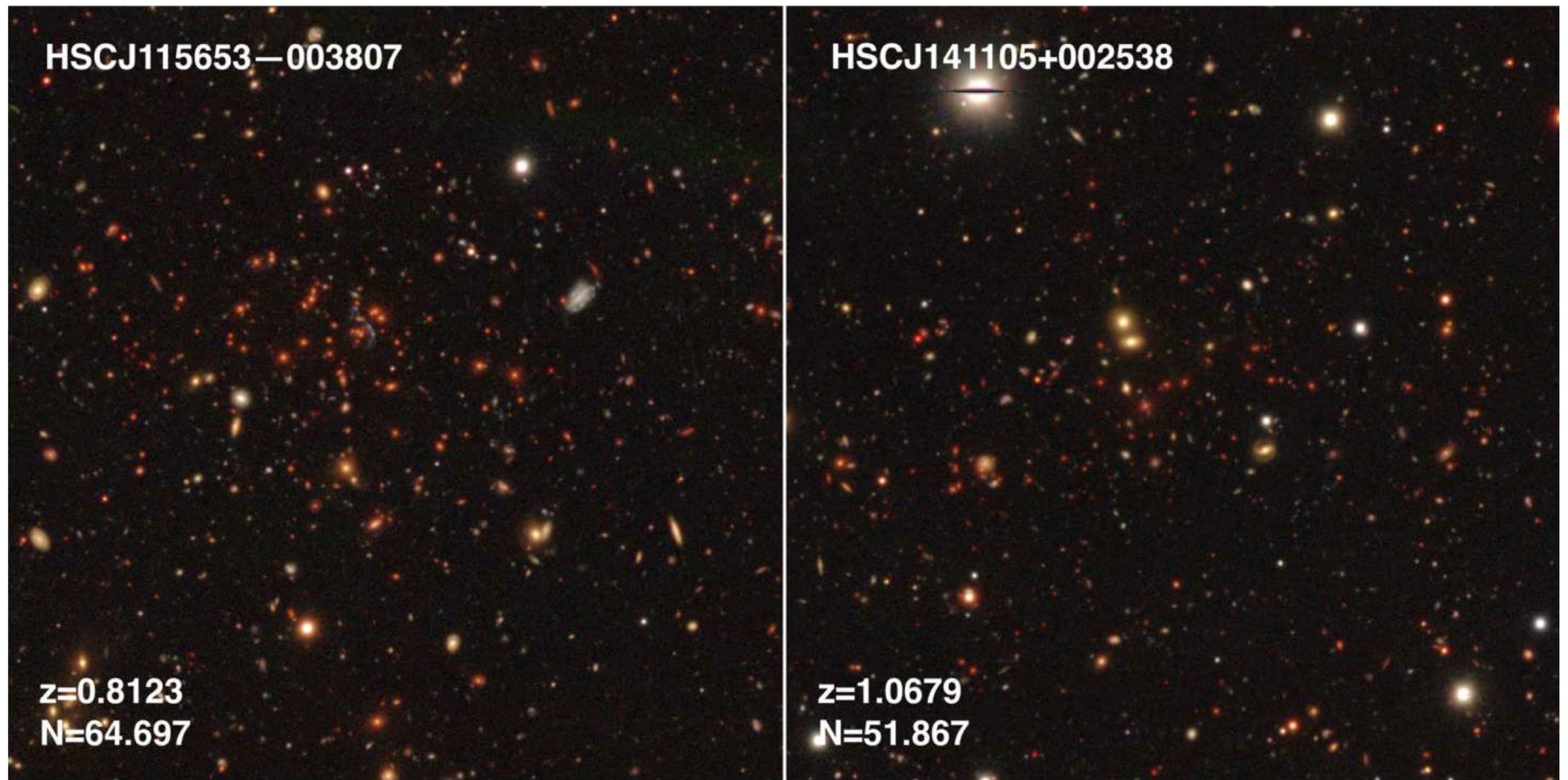




# the HSC cluster sample

targeting clusters with prominent red sequence, *camira* (cluster finding algorithm based on multi-band identification of red sequence galaxies) has found  $\sim 1900$  clusters at  $z=0.1-1.1$  over  $230 \text{ deg}^2$  with richness  $N \geq 15$  in the HSC survey

Oguri, Lin+18

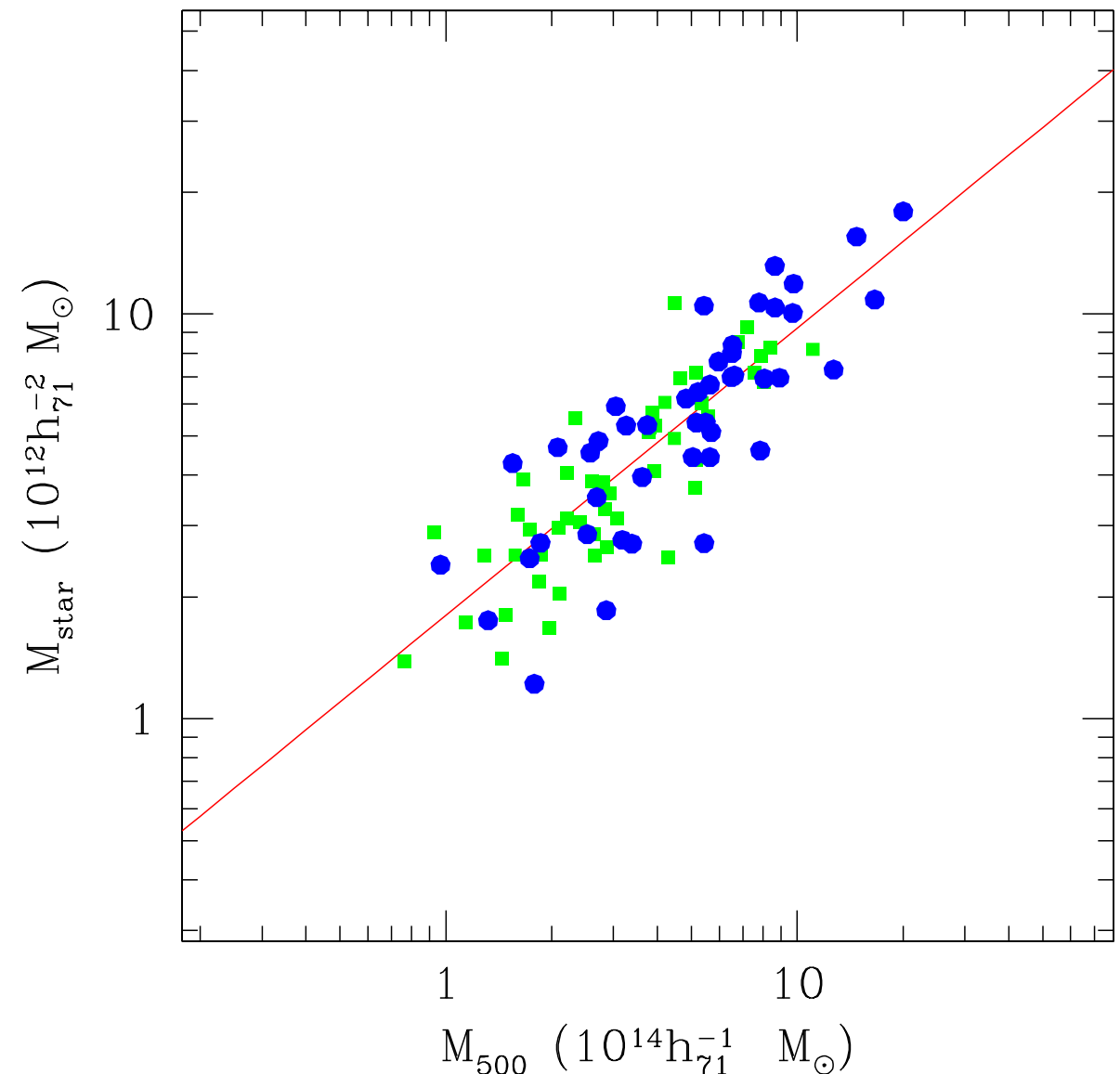


# elements of analysis

*stellar mass*: derived with a machine-learning algorithm

*stellar mass distribution*: constructed using a statistical background correction scheme

$M_{star}$ : obtained by integrating the SMD

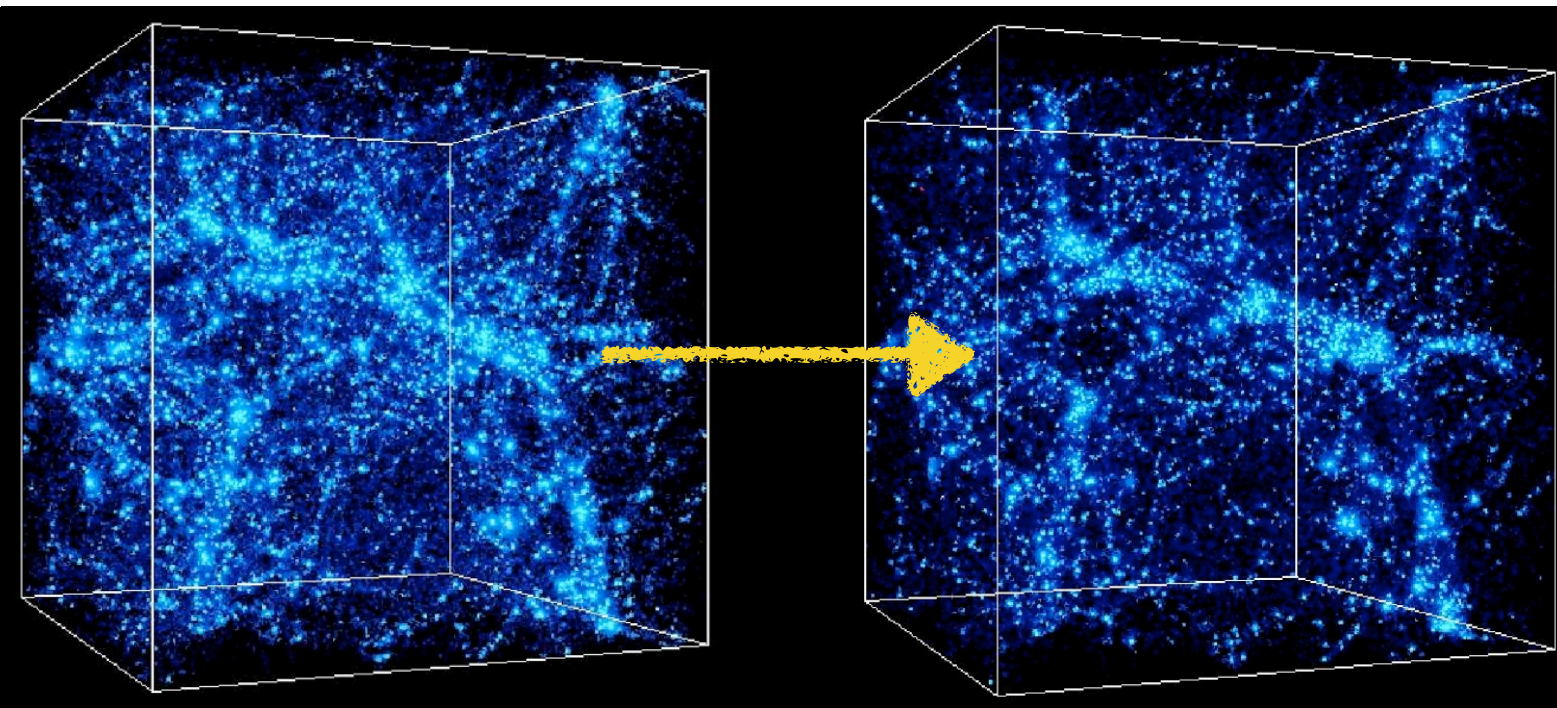


*cluster selection*: use cluster (sub)samples that can be considered to form an evolutionary sequence: high- $z$  cluster (sub)sample to have properties consistent with progenitors of low- $z$  (sub)samples  $\Rightarrow$  *top N* selection

*cluster mass*: weak lensing / abundance-based estimates



# *top N* selection of halos



initial $z$	Remaining Fraction (%)					
	final $z$ (no scatter)			final $z$ (25% scatter)		
	0.83	0.68	0.45	0.83	0.68	0.45
0.98	86	76	66	62	67	58
0.83	–	86	70	–	64	55
0.68	–	–	79	–	–	58

for  $N=100$  over 60% Millennium volume;  
4 redshift bins from 0.3 to 1.02

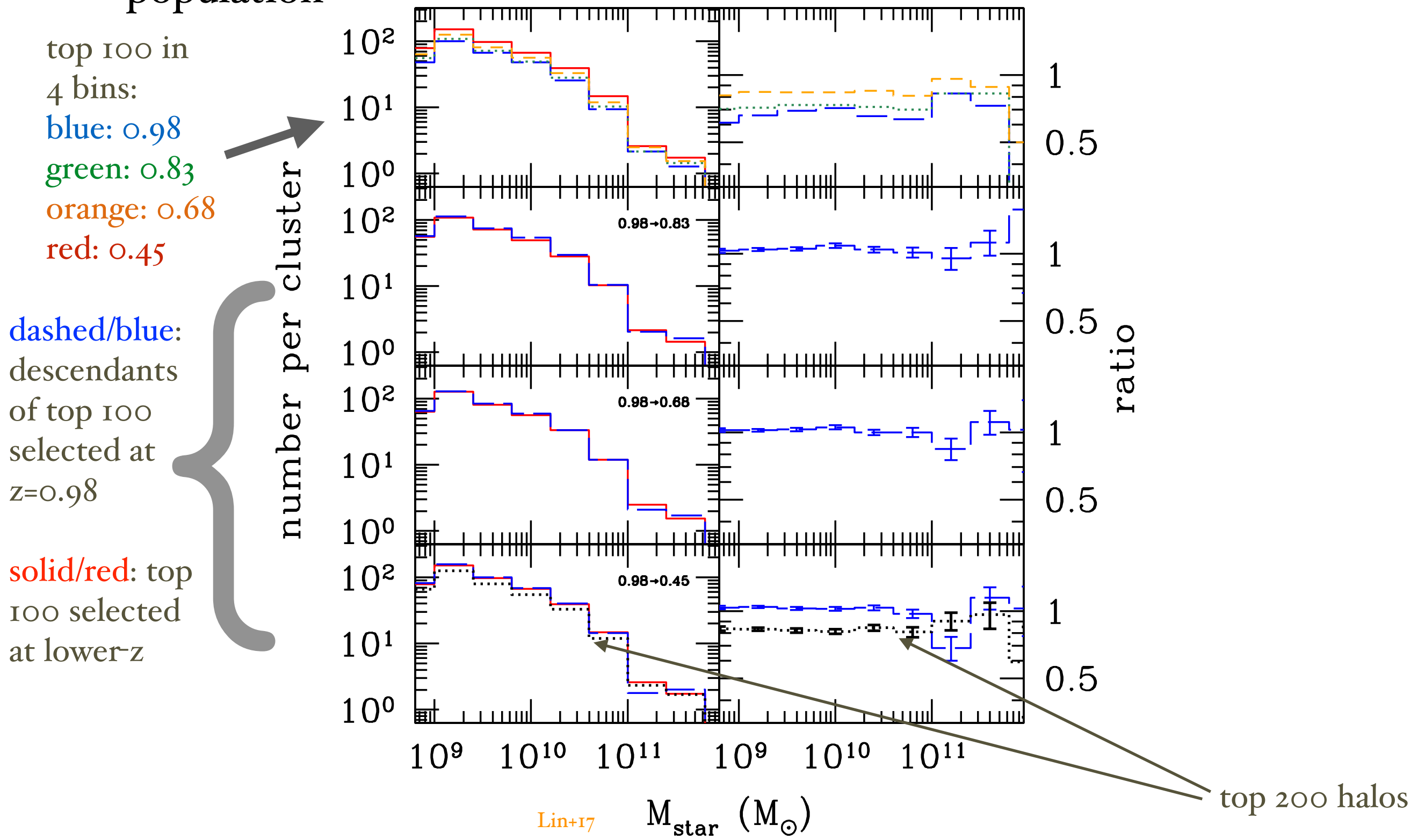
A. Kravtsov

- construct cluster samples that represent progenitor-descendant relationship *statistically*
- Ansatz: given comoving volume, the most massive  $N$  halos will remain among the most massive  $N$  at a later time
- similar in spirit to the fixed cumulative number density selection for field galaxies
- tests with Millennium simulation suggest above holds to  $\sim 65\%$  (including scatter in mass-observable relation), even with  $\Delta z \sim 0.6$



# *top N* selection of halos

tests with semi-analytic models show good recovery of galaxy population

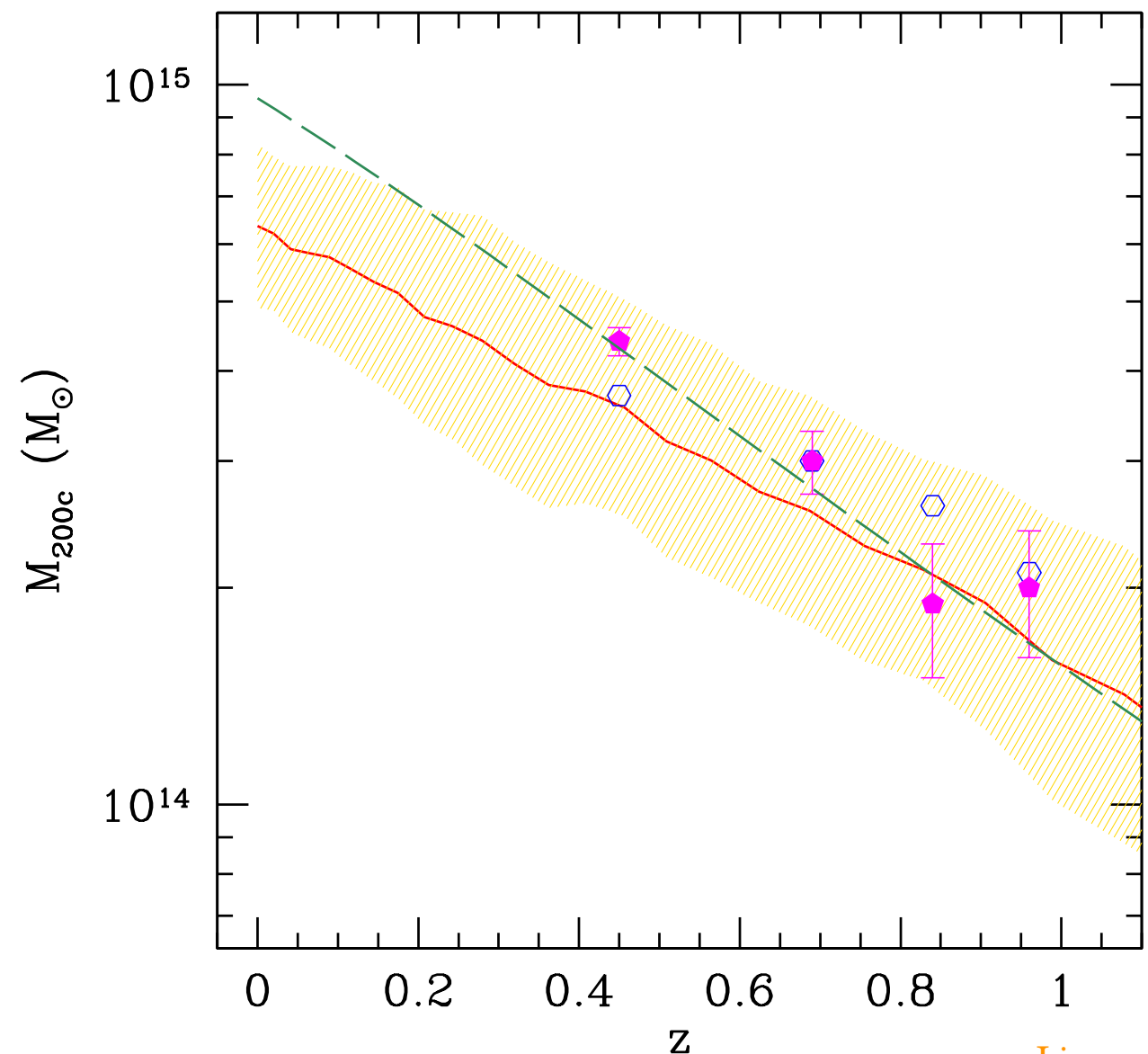


# halo mass estimates

- two methods
  - mean mass of top 100 halos over  $(420h^{-1}\text{Mpc})^3$  in Millennium, with reasonable assumptions in mass-observable relation (open circles)
  - stacked weak lensing (solid points)
- from  $\sim 2 \times 10^{14} M_{\text{sun}}$  at  $z \sim 1$  to  $\sim 4 \times 10^{14} M_{\text{sun}}$  at  $z \sim 0.45$
- descendant mass at  $z \sim 0$  likely in  $(6-10) \times 10^{14} M_{\text{sun}}$

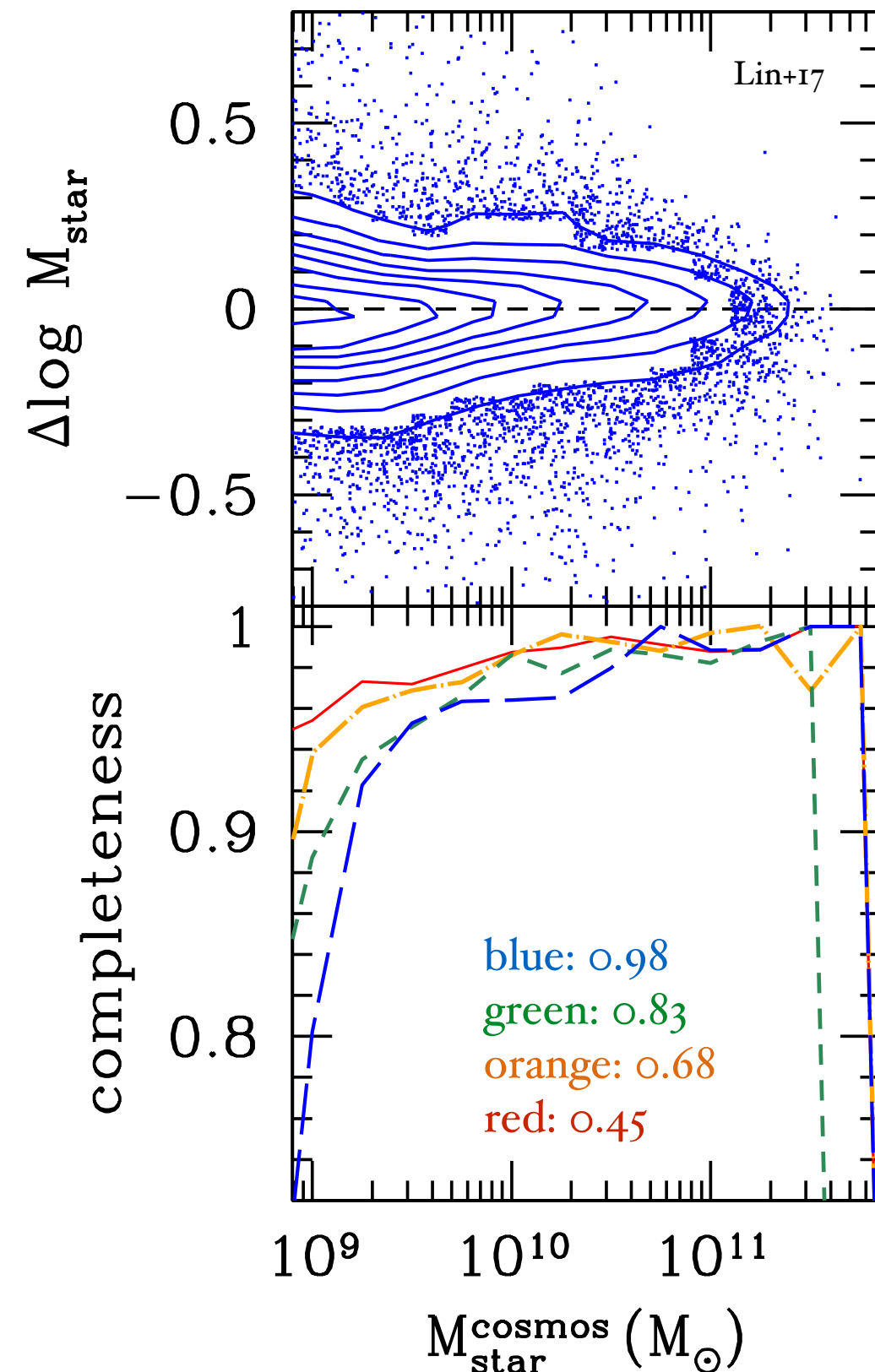
Basic Cluster Properties

bin	redshift range	mean $z$	stacked lensing		abundance		$\hat{N}_{\text{lim}}$
			$M_{200}$ ( $10^{14} M_{\odot}$ )	$r_{200}$ (Mpc)	$M_{200}$ ( $10^{14} M_{\odot}$ )	$r_{200}$ (Mpc)	
1	0.30–0.60	0.45	$4.4 \pm 0.2$	1.33	3.7	1.27	30.0
2	0.60–0.77	0.69	$3.0 \pm 0.3$	1.07	3.0	1.09	22.7
3	0.77–0.90	0.84	$1.9 \pm 0.4$	0.86	2.6	0.98	21.6
4	0.90–1.02	0.96	$2.0 \pm 0.4$	0.84	2.1	0.87	18.0



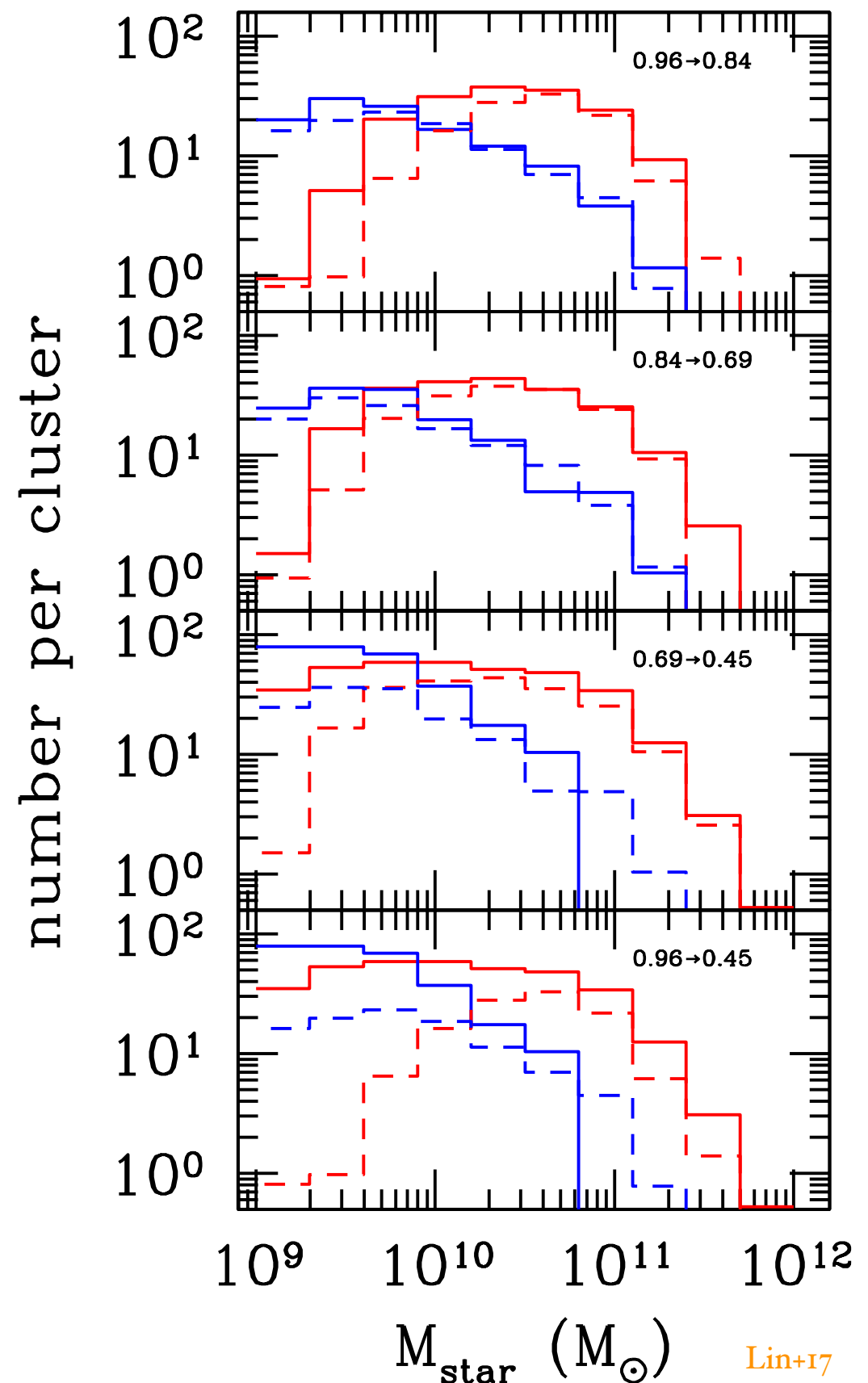
# stellar mass estimates

- for galaxies at  $z > 0.8$ , the HSC *grizy* photometry does not sample much of restframe optical, resulting in biases in stellar mass estimates based on SED fitting
- we thus use a machine learning algorithm, Direct Empirical Method (DEmP, Hsieh & Yee 2014), for the task
- hybrid of linear regression and nearest neighbor
- COSMOS2015 and HSC ultra-deep catalogs used as training set, applied to HSC wide data
- our estimates are unbiased with low scatter
- highly complete above  $10^{10} M_{\text{sun}}$



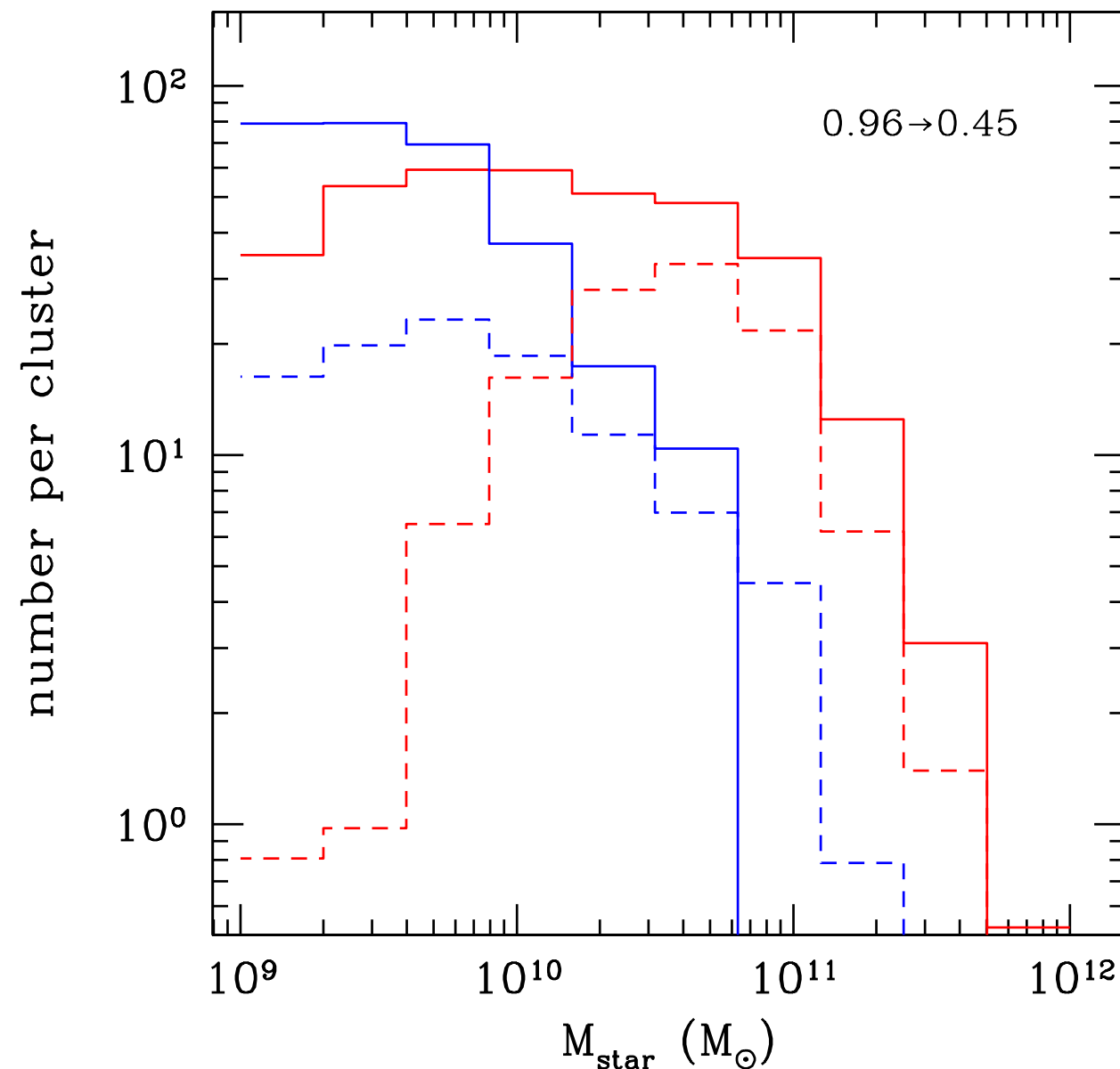
# stellar mass distribution

- each panel shows pairwise comparison of SMDs (no BCGs) in two redshift bins for red and blue galaxies
  - dashed = higher- $z$ ; solid = lower- $z$
- completeness corrections applied
- apparent growth at both very high mass and low mass ends
  - (except for disappearance of massive blue galaxies)
  - for  $M > 10^{10} M_{\text{sun}}$  red galaxies, abundance at  $z=0.45$  is 2x that at  $z=0.96$
  - for lower mass red galaxies, difference is 7x (down-sizing!)
  - ratios for blue ones are 1.5x and 3x



# stellar mass distribution

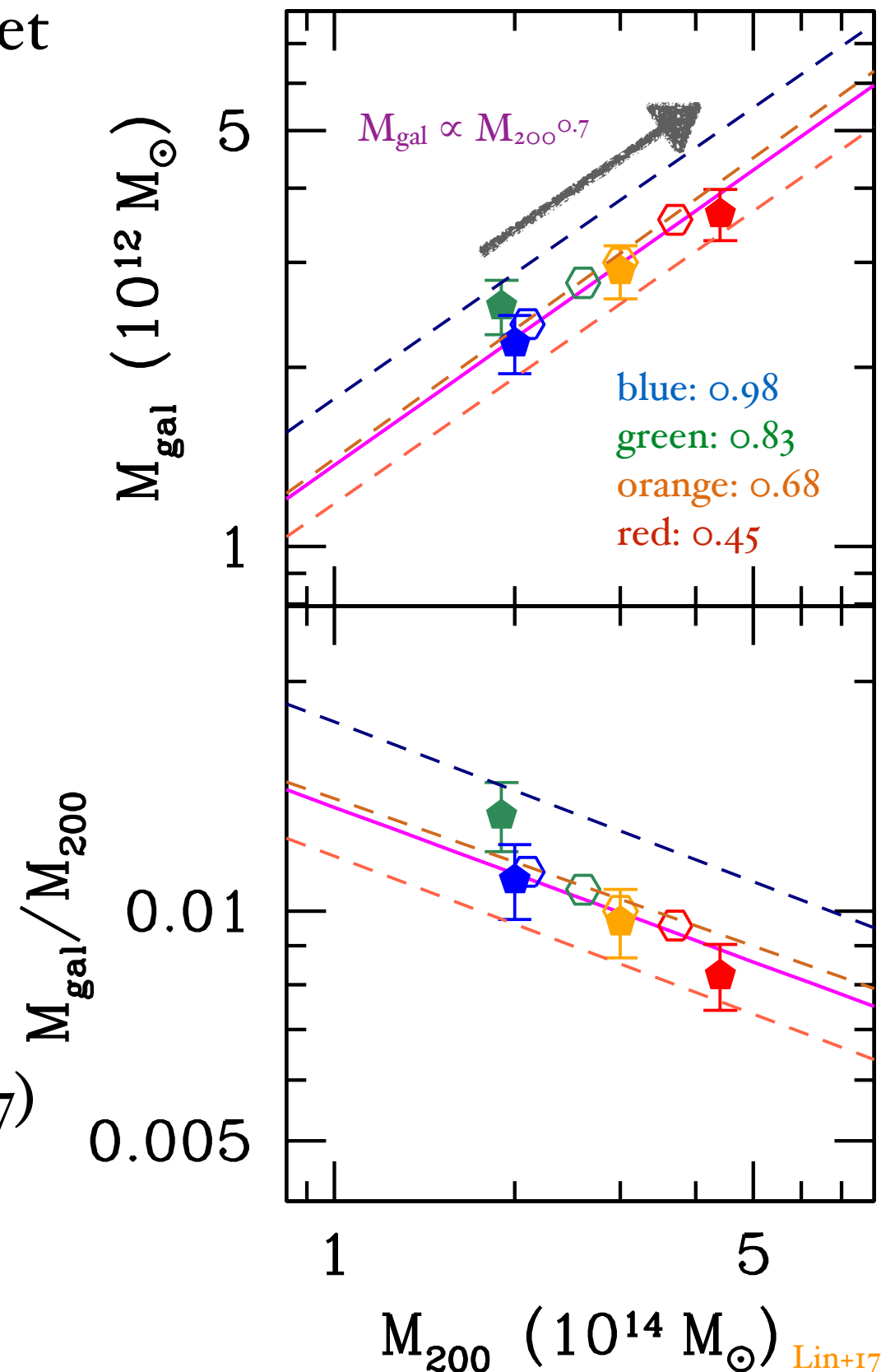
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# stellar mass contents of clusters

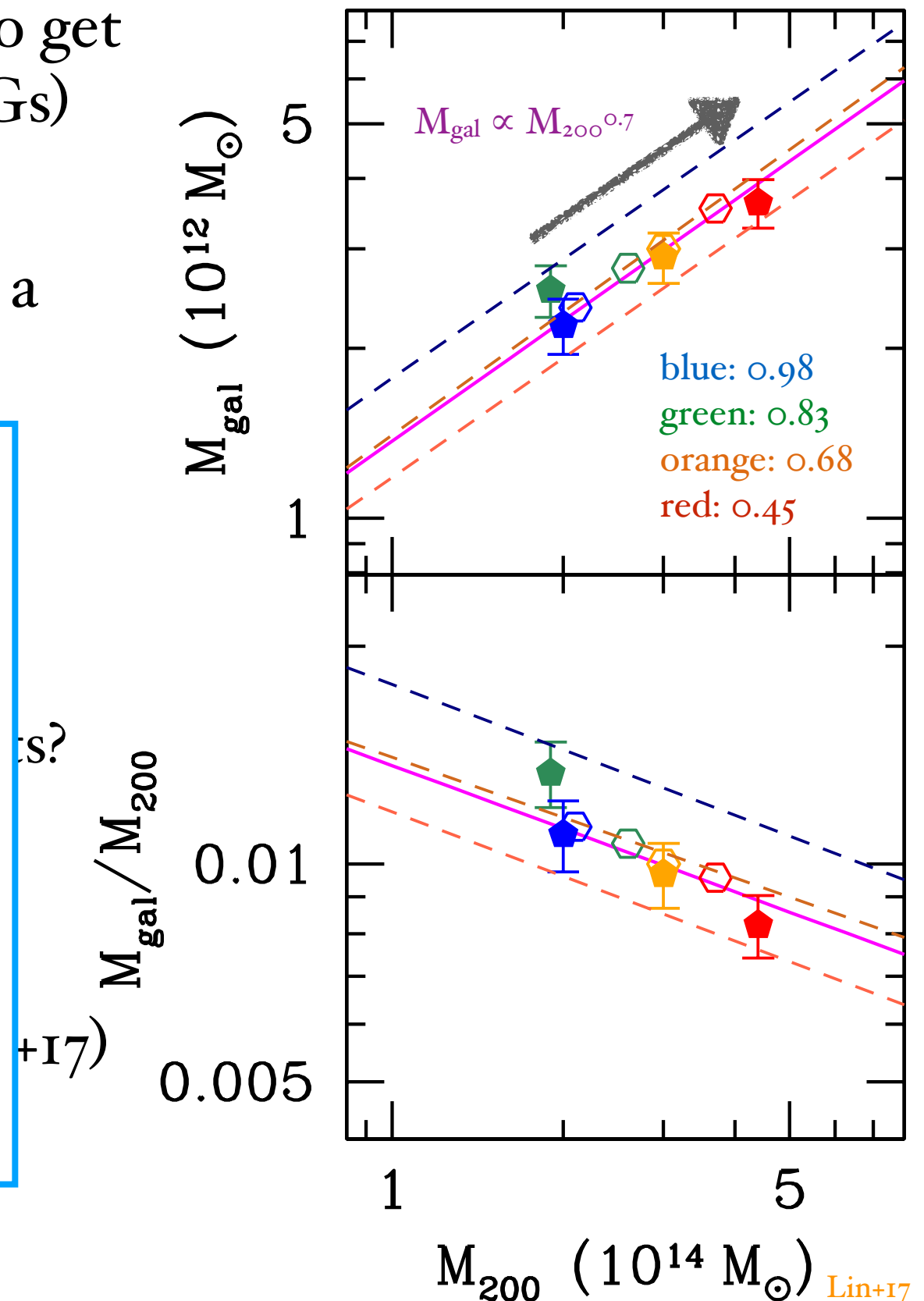
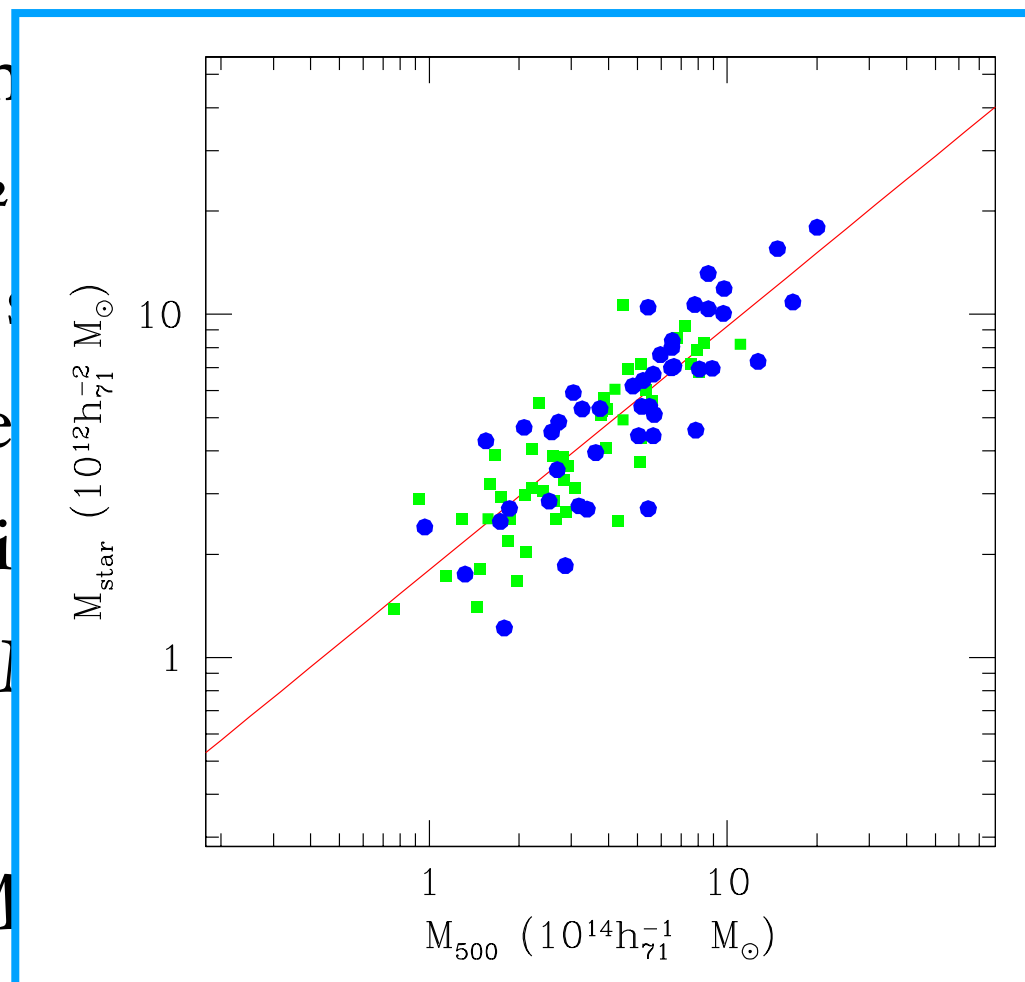
- integrate the SMD down to  $10^{10} M_{\text{sun}}$  to get “total” stellar mass  $M_{\text{gal}}$  (including BCGs)
- clusters move along the  $M_{\text{gal}} \propto M_{200}^{0.7}$  locus (solid line, taken from Lin+12 for a totally different sample)
- why is there no/little evolution of the  $M_{\text{gal}}-M_{200}$  relation?
  - lots of stripping required?
  - preferentially accreting high M/L objects?
  - operating at all redshifts!
  - would  $M_{\text{gal}} \propto M_{200}$  at any early epoch?
- also seen in SPT-selected clusters (Chiu+17) & COSMOS groups (Giodini+09)



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- clusters move along the  $M_{\text{gal}} \propto M_{200}^{0.7}$  locus (solid line, taken from Lin+12 for a totally different sample)

- why is the  $M_{\text{gal}} - M_{200}$  relation?
- lots of scatter
- preference for BCGs
- operational definition of clusters
- would like to know the true mass
- also seen in COSMOS



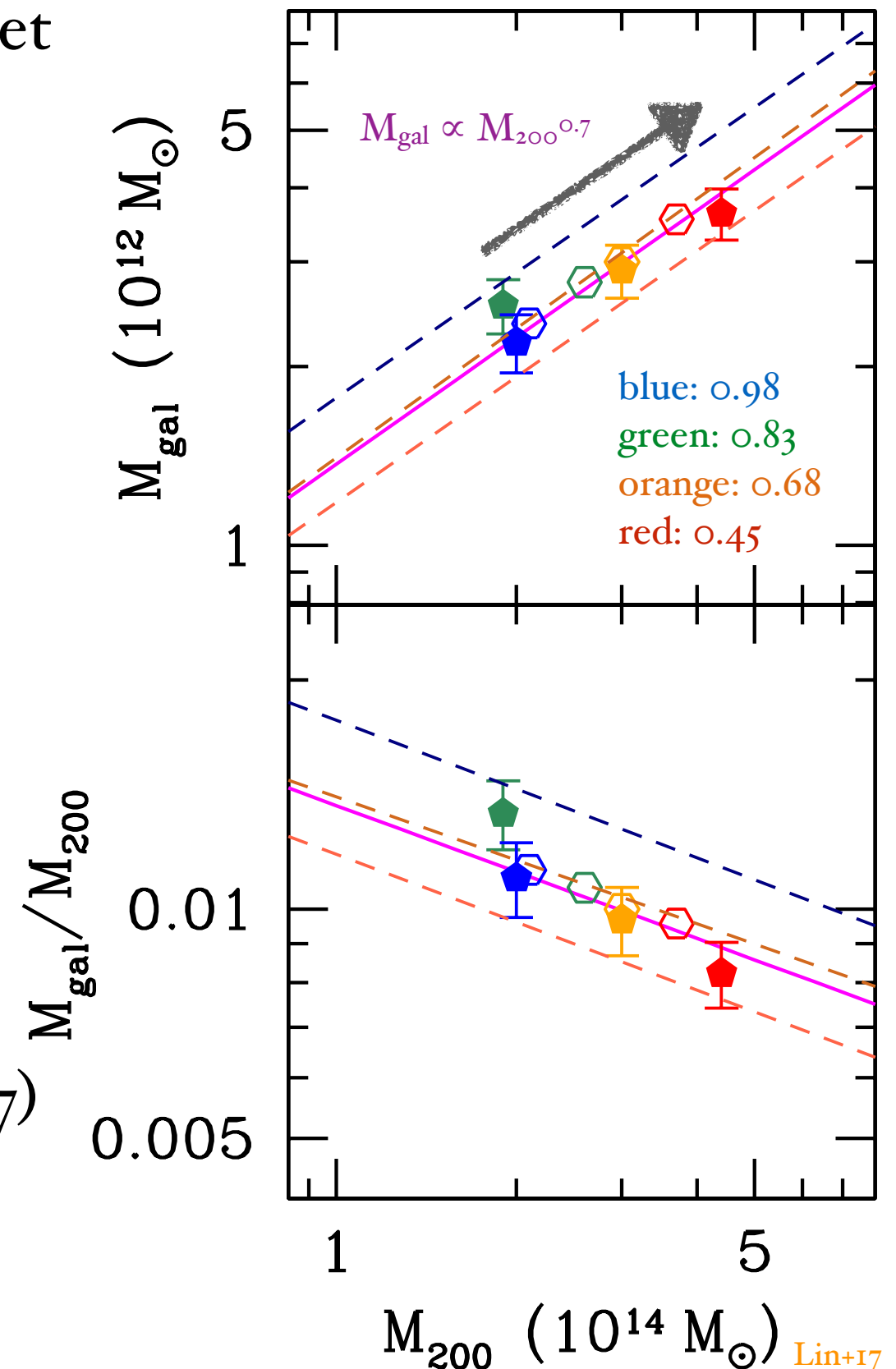
# stellar mass contents of clusters

- integrate the SMD down to  $10^{10} M_{\text{sun}}$  to get “total” stellar mass  $M_{\text{gal}}$  (including BCGs)

- Taking merger trees of massive halos from Millennium; for every halo that forms, we assign some stellar mass to it (following a simple  $M_{\text{star}}-M_{\text{halo}}$  prescription). When two halos merge, some fraction  $f_{\text{loss}}$  of stars are assumed to be lost to intrahalo or interhalo space.

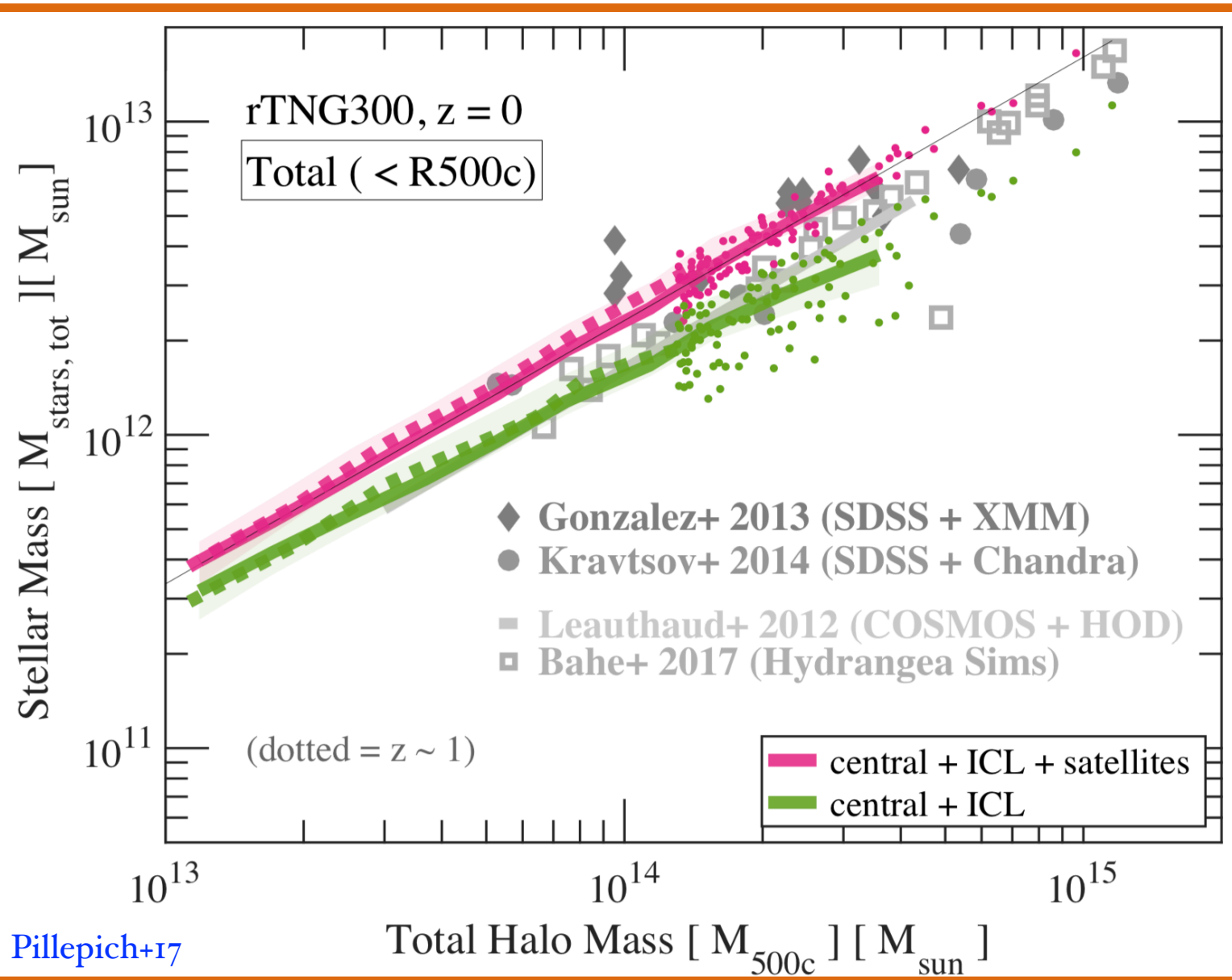
- It is found that, to produce a slope of  $-0.7$ ,  $f_{\text{loss}} \sim 0.4$  is needed; even so, the model cannot produce a constant amplitude of the scaling relation...

- also seen in SPT-selected clusters (Chiu+17) & COSMOS groups (Giodini+09)

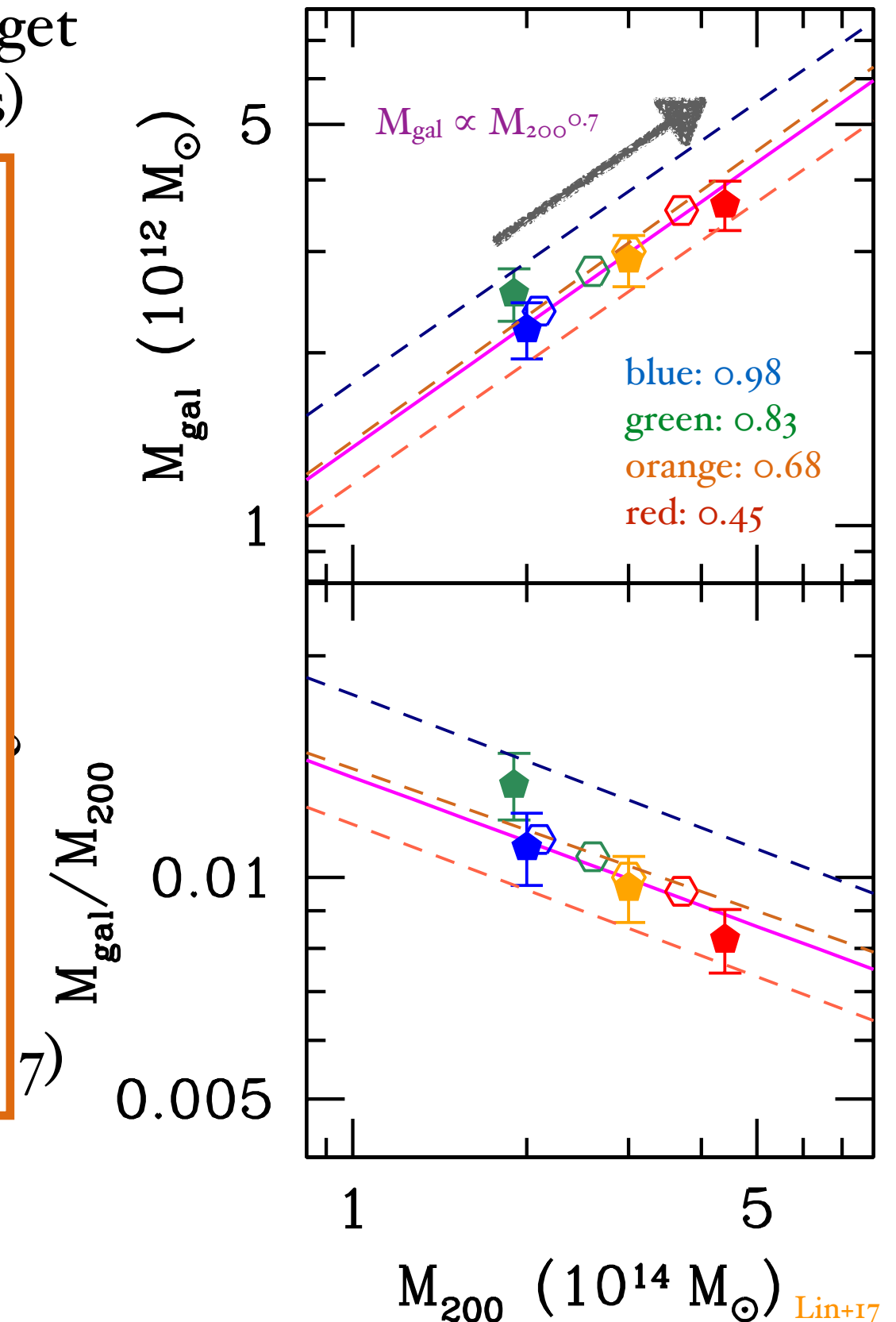


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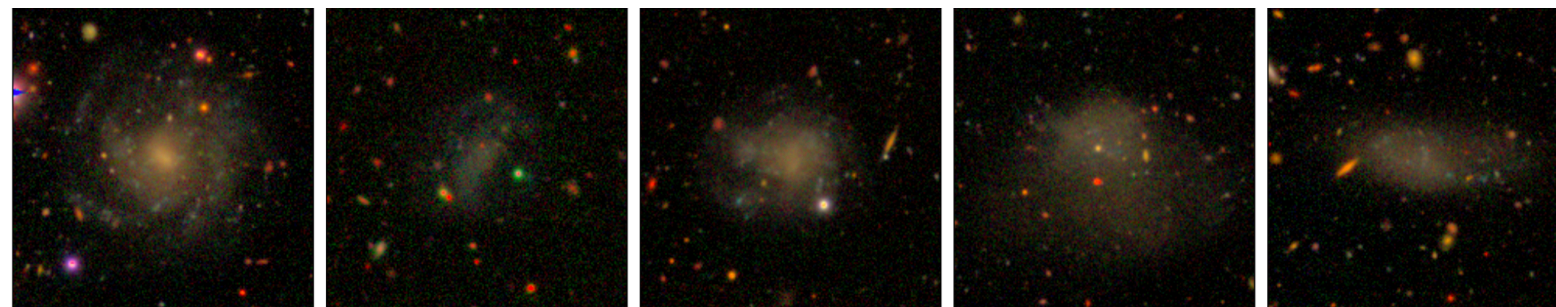
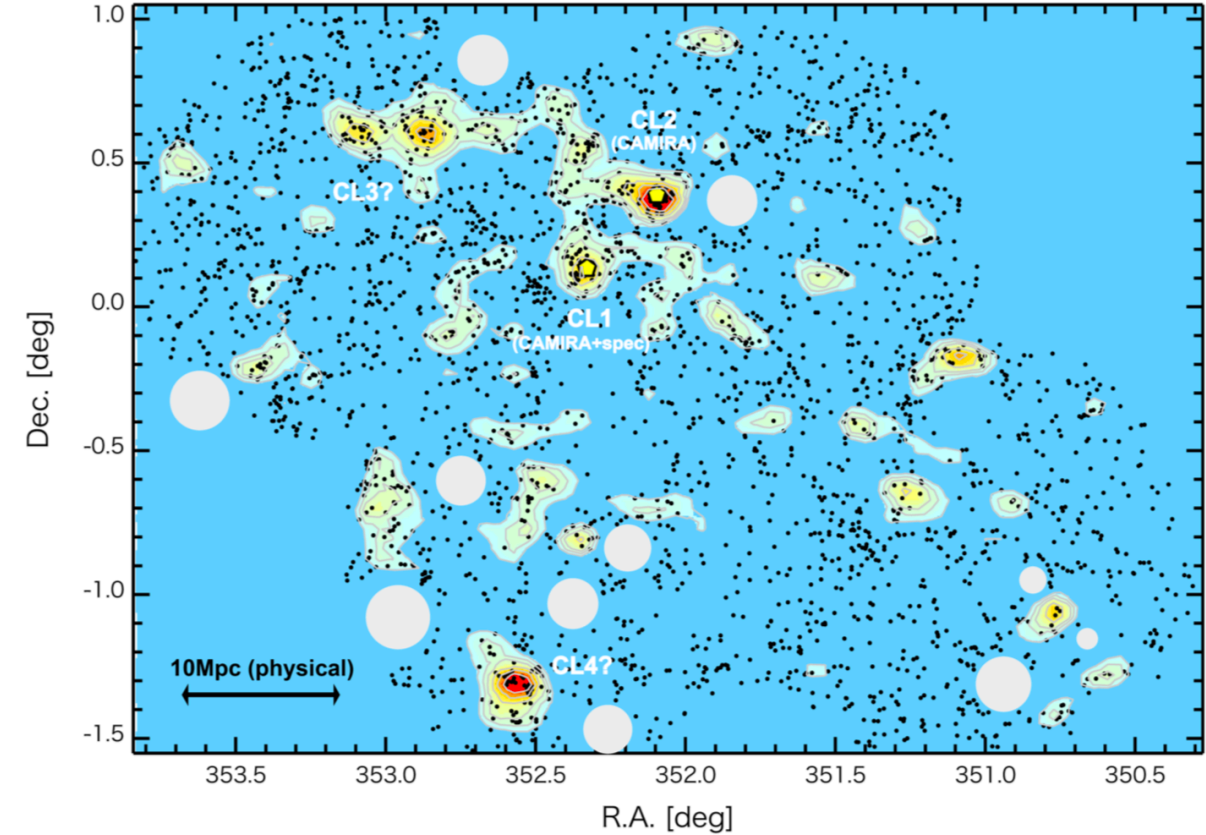
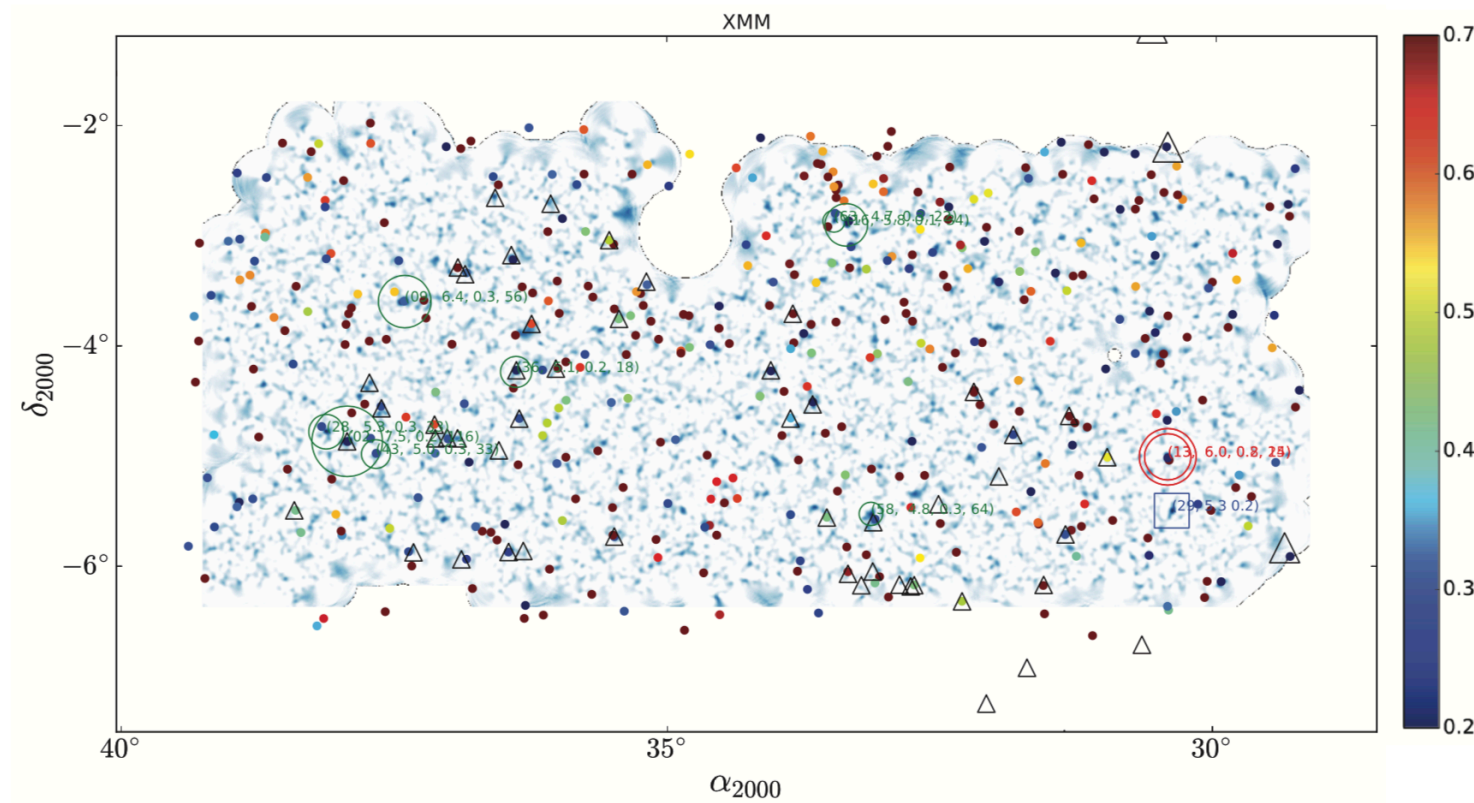
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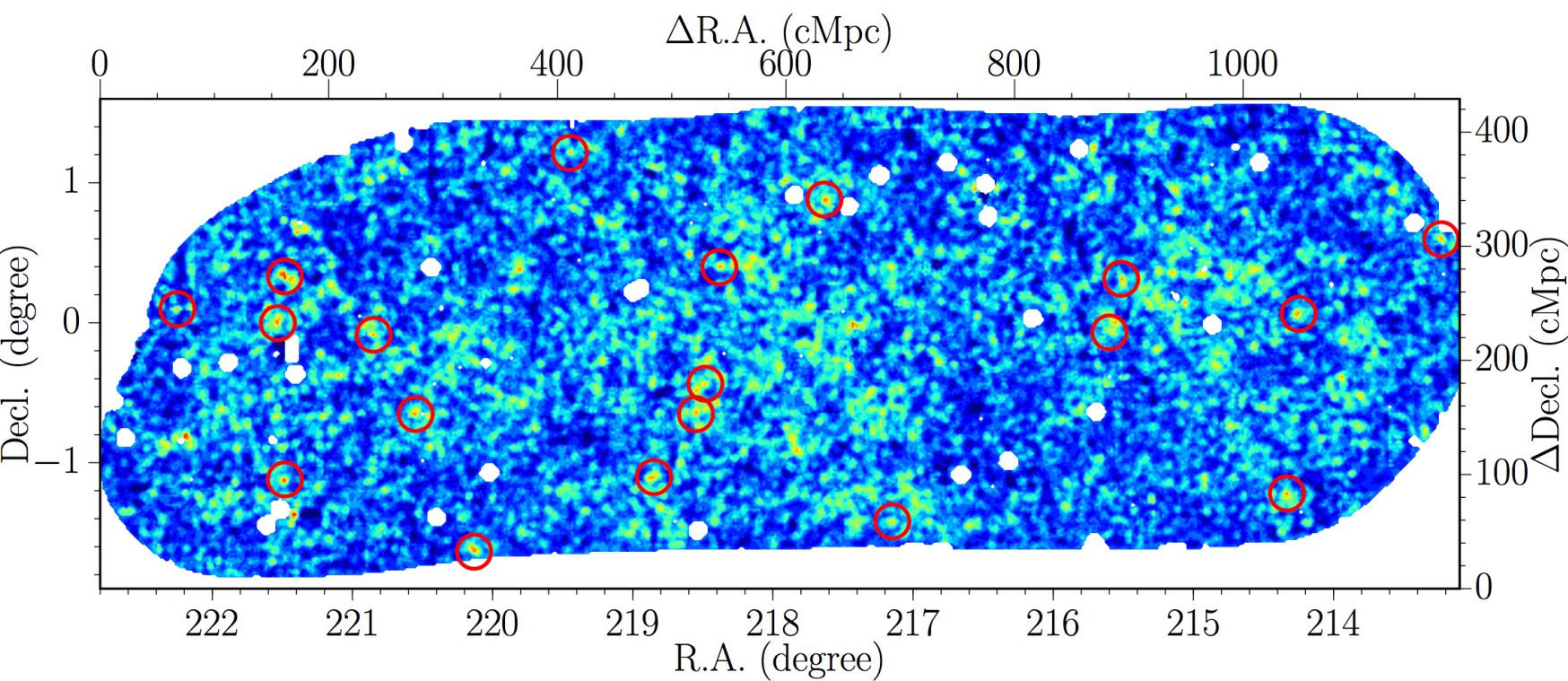
& COSMOS groups (Giordini+09)







781 LSBGs (Greco+18)





# the next decade

- how to push cluster studies to higher redshift ( $z > 1.4$ ), with a large and homogeneously selected sample?
  - eROSITA; next-generation Sunyaev-Zel'dovich surveys
  - Large Synoptic Survey Telescope (LSST)
  - Euclid / WFIRST
  - Subaru Prime Focus Spectrograph (PFS) survey
- with the near-IR coverage, Euclid seems most promising for delivering such a sample
- PFS offers complementary samples
  - overdensities selected from emission line ([OII]) galaxies from cosmological survey ( $\sim 2000 \text{ deg}^2$ )
  - groups and clusters from J-band selected, densely sampled spectroscopic galaxy sample in the galaxy evolution survey ( $\sim 15 \text{ deg}^2$ )

- larger collaboration: Japan, ASIAA, Princeton, JHU, Caltech/JPL, LAM, Brazil, MPA, Chinese participation group, US Northeast participation group
- 1.3 deg diameter FOV
- 2394 fibers with Cobra fiber positioners, <2min reconfigure time
- 380-1260nm spectral coverage
  - 4 spectrographs each with 3 arms
- key sciences
  - cosmology
  - galaxy and AGN evolution
  - Galactic archaeology



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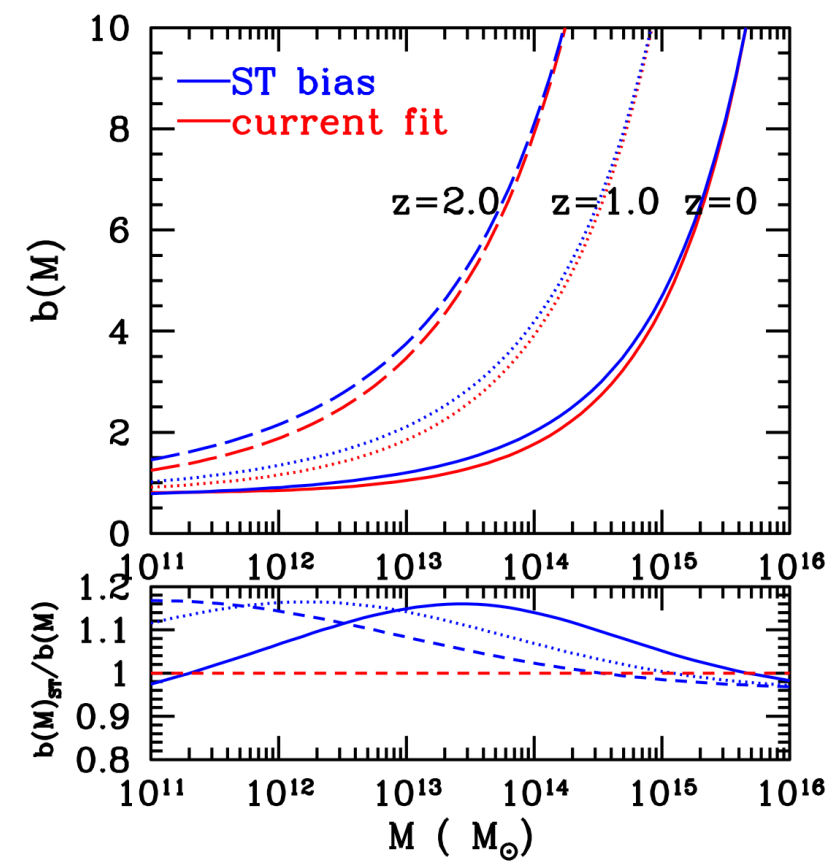
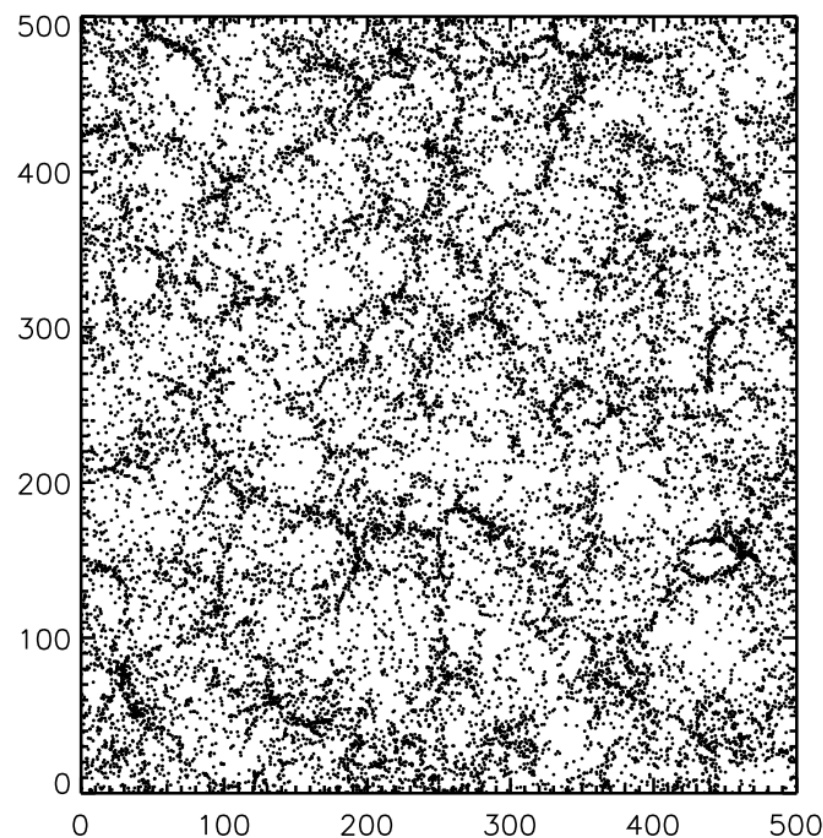
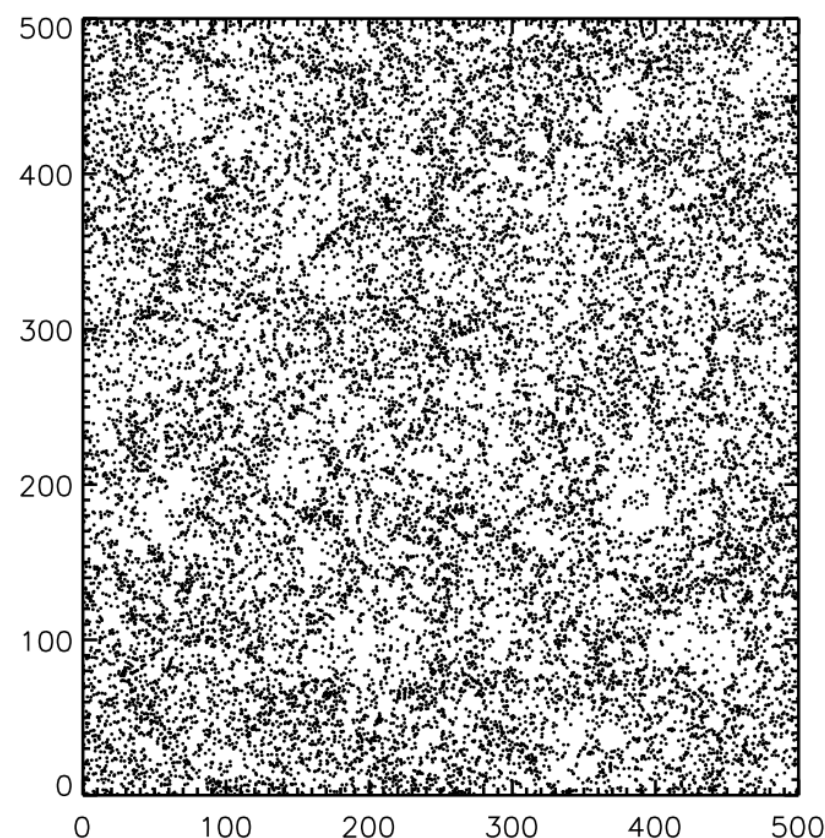
detecting halo assembly bias



# assembly bias?

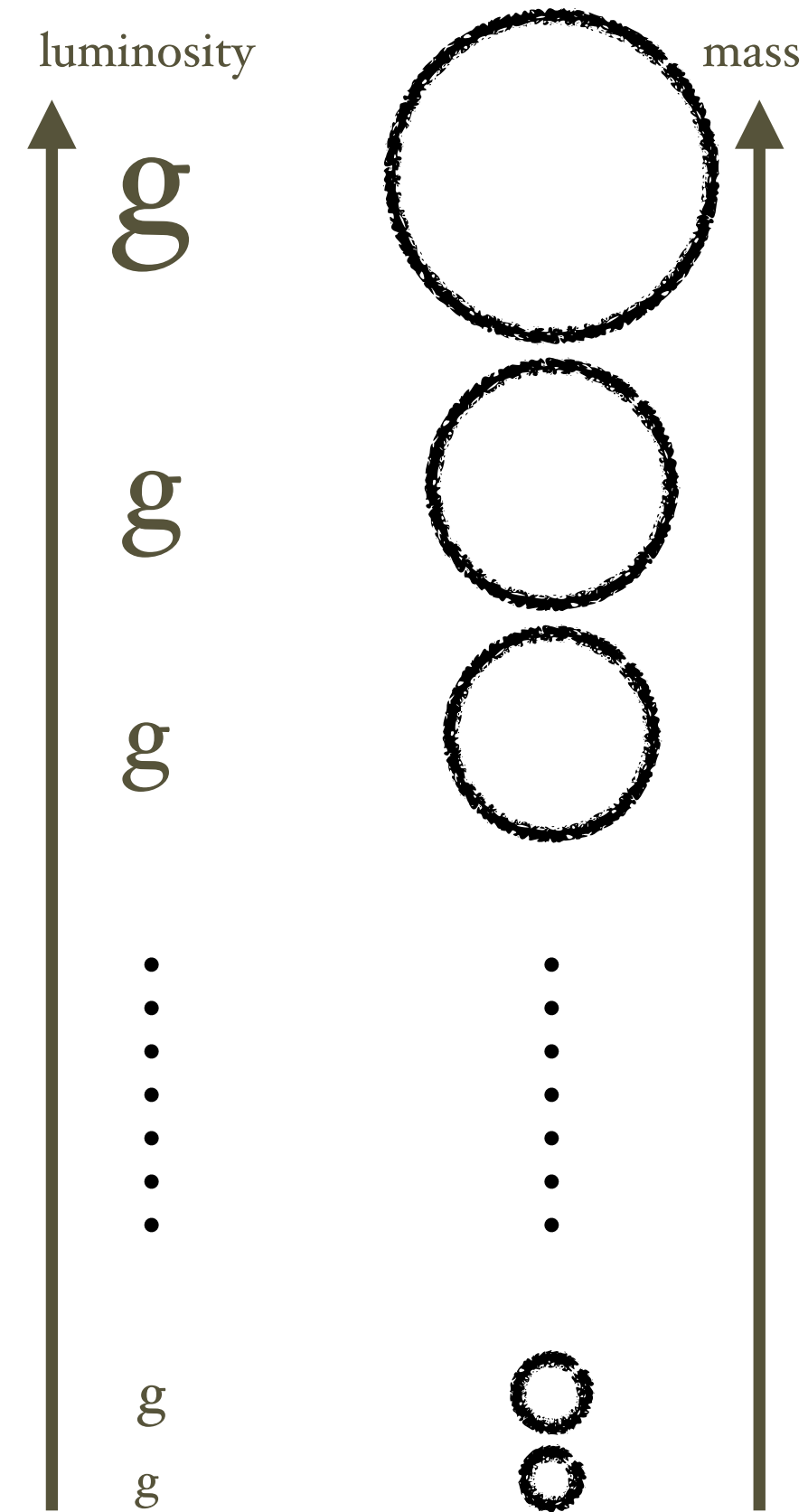
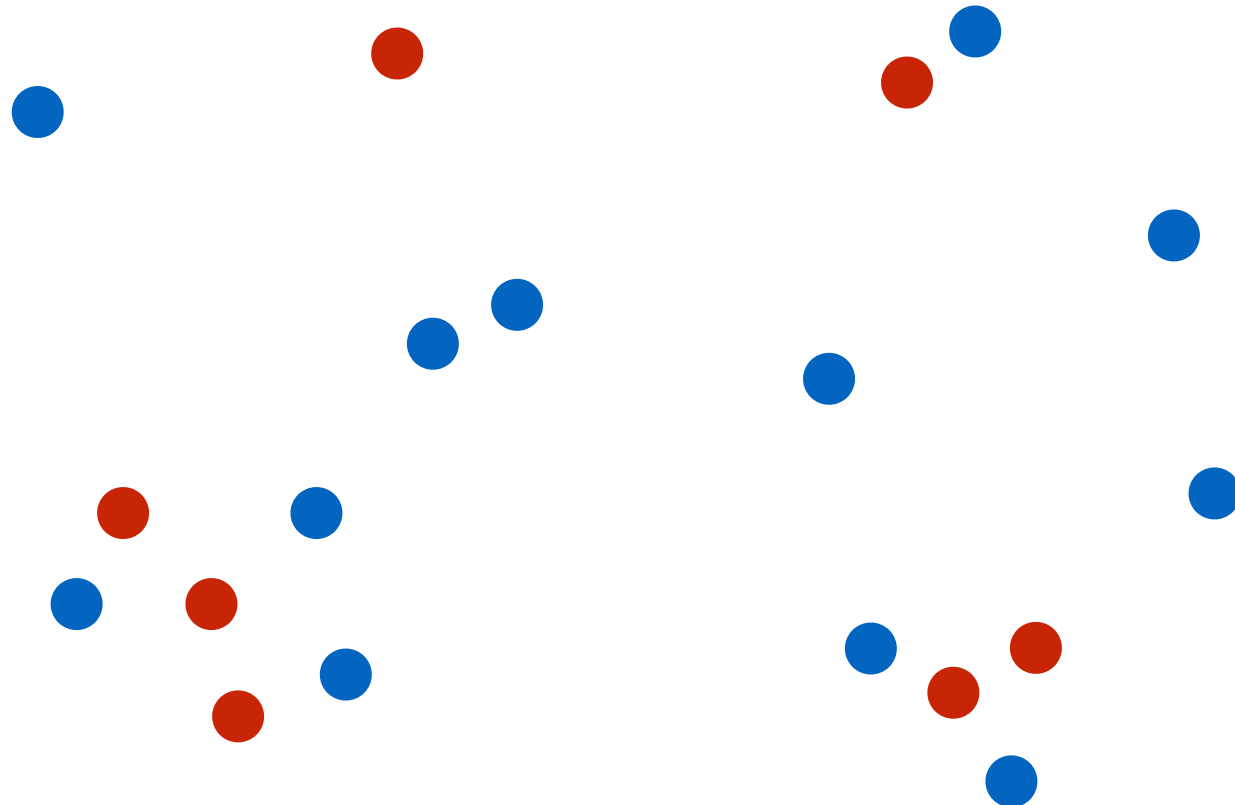
- dark matter halo bias primarily is a function of halo mass
  - more massive halos are more biased
- a secondary effect is *assembly bias*: bias also depends on the halo formation time
  - for low mass halos ( $\sim 10^{12} h^{-1} M_{\text{sun}}$ ), those that form earlier would cluster more strongly (having  $\sim 40\%$  larger bias)
  - for cluster scale halos the amplitude is smaller

Gao+05, Bhattacharya+11



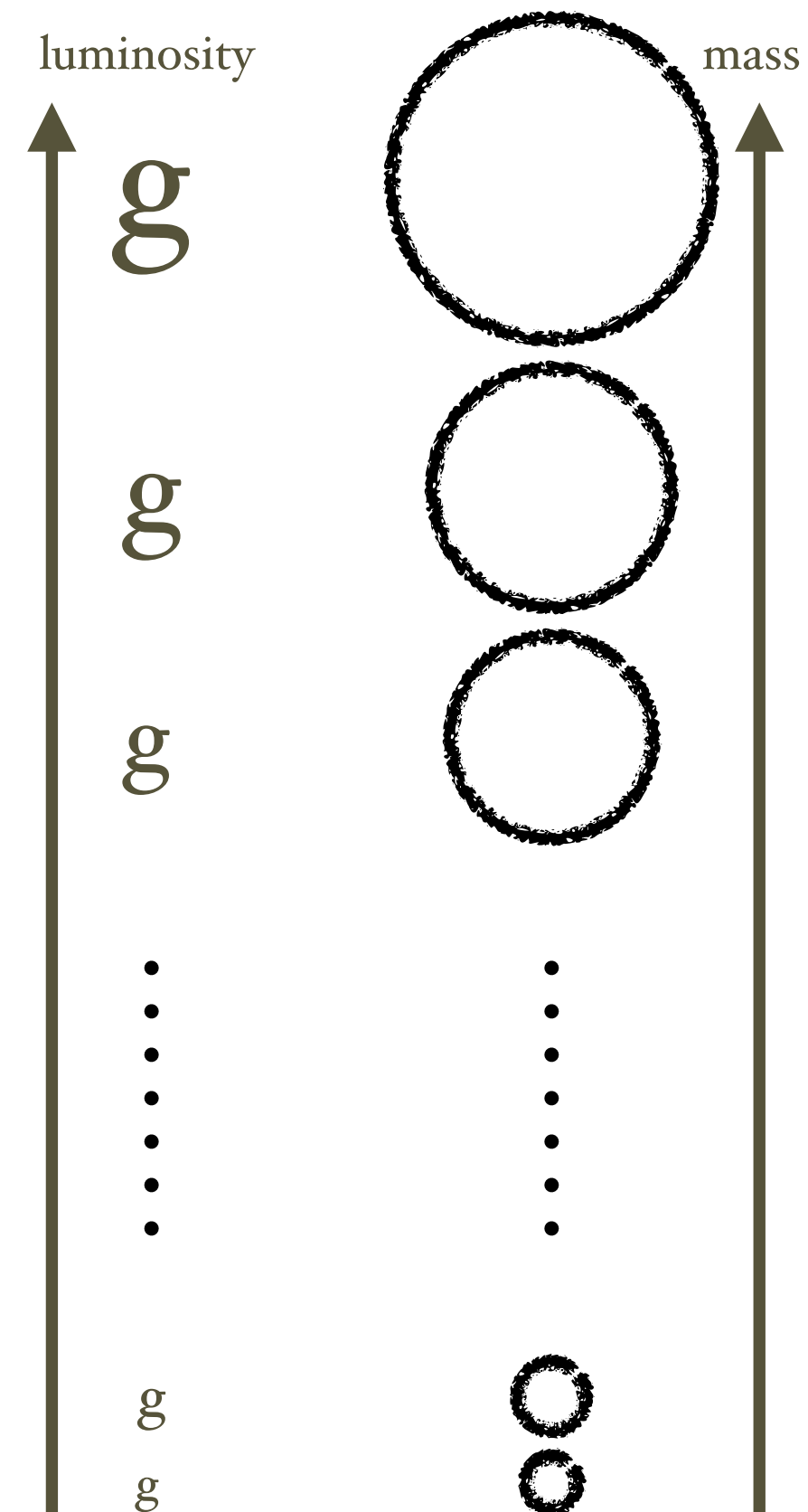
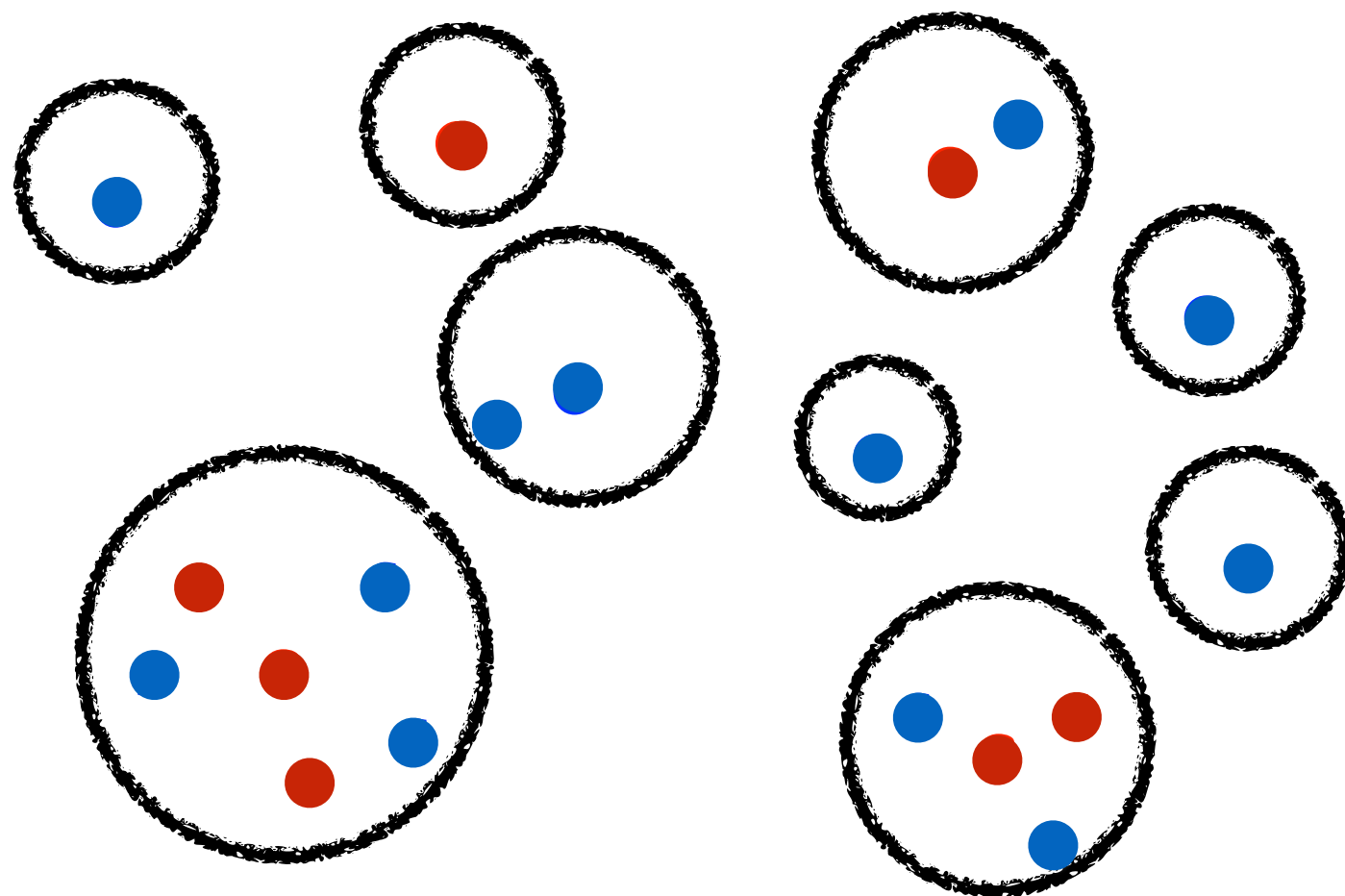
# wasn't this detected long ago?

- Yang+06 first claimed detection
  - a catalog that classifies galaxies into single and multiple galactic systems
  - designation of central vs satellite galaxies
  - halo mass *assigned* to each system à la abundance matching technique



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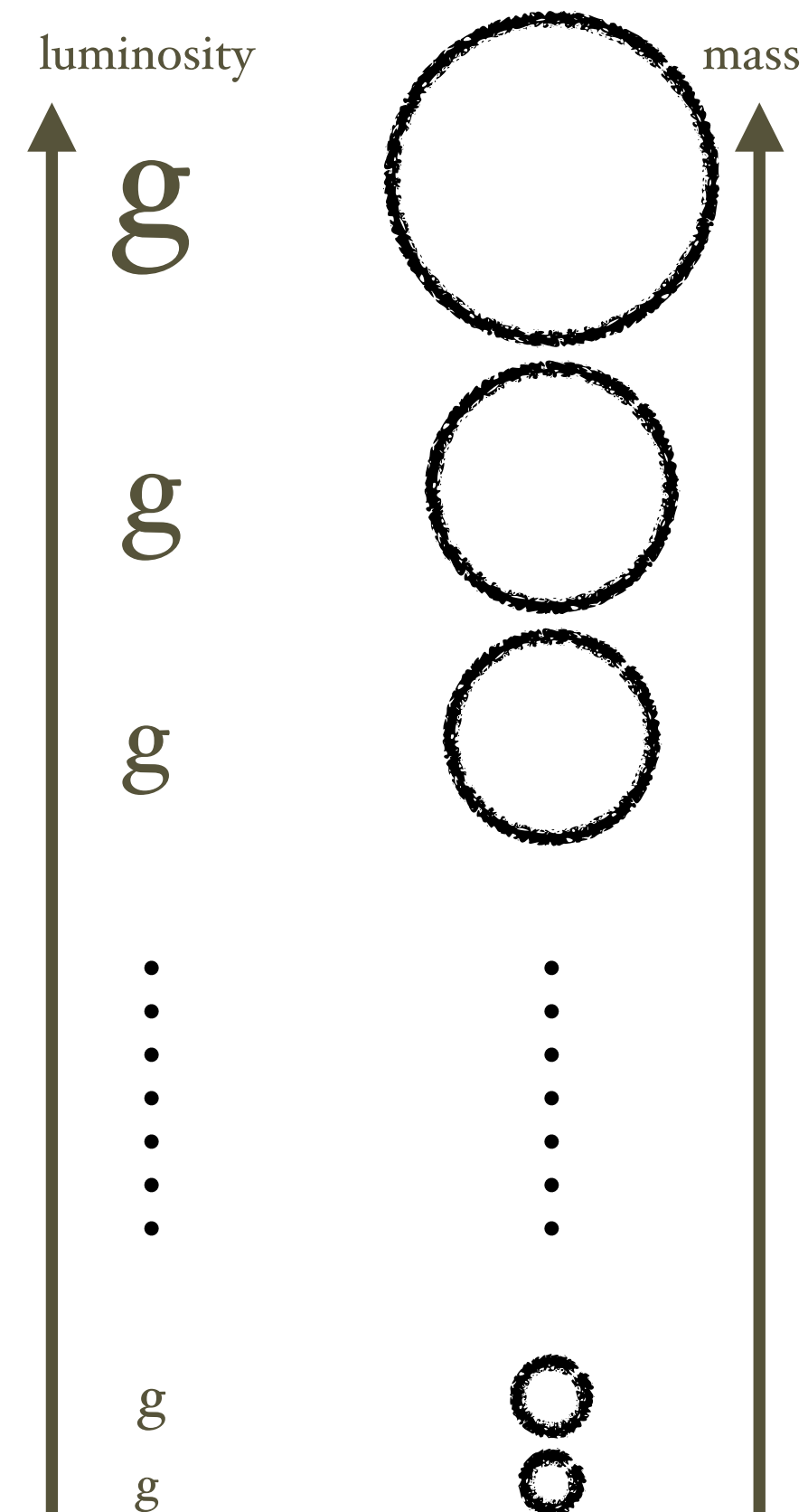
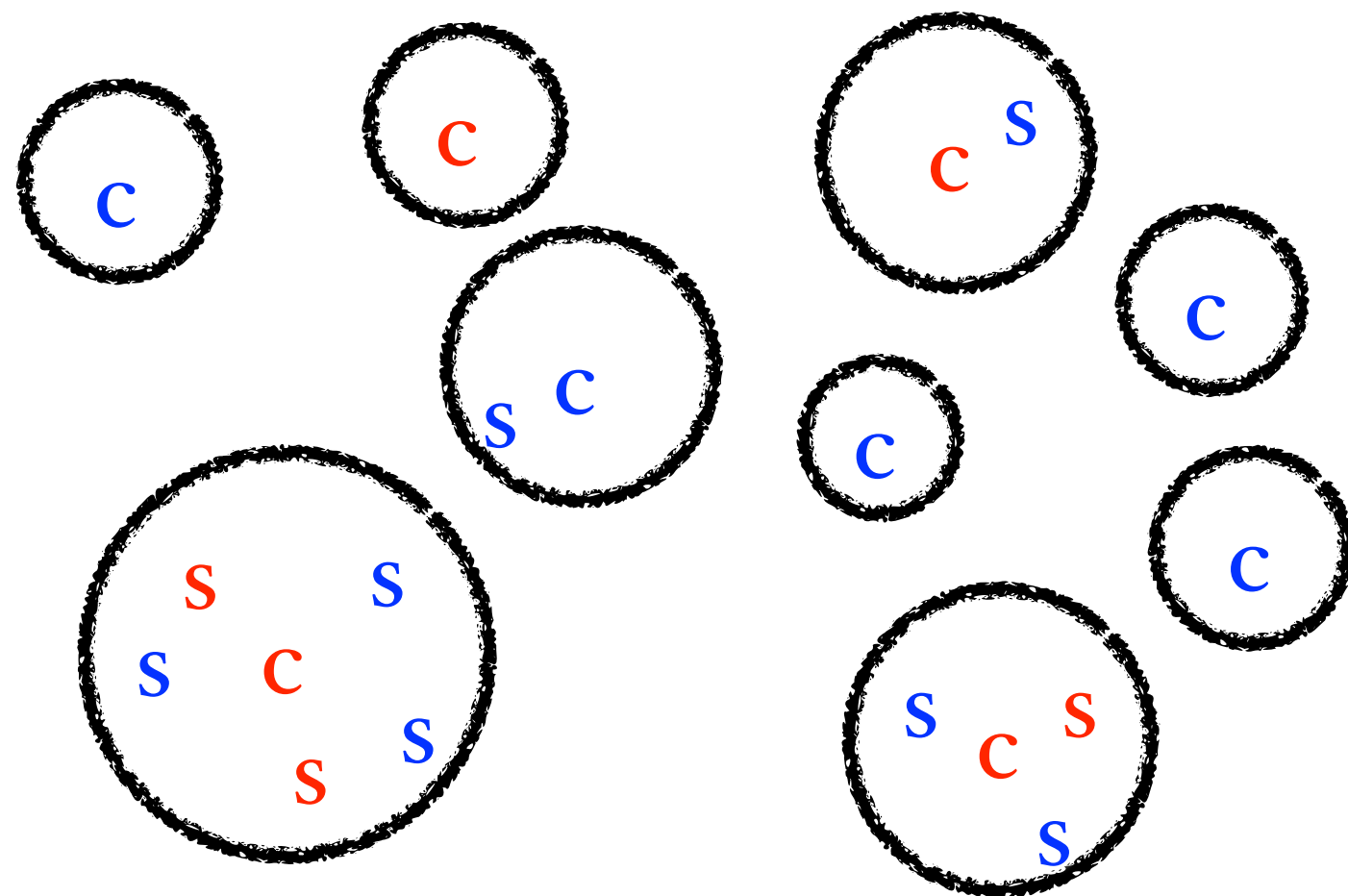
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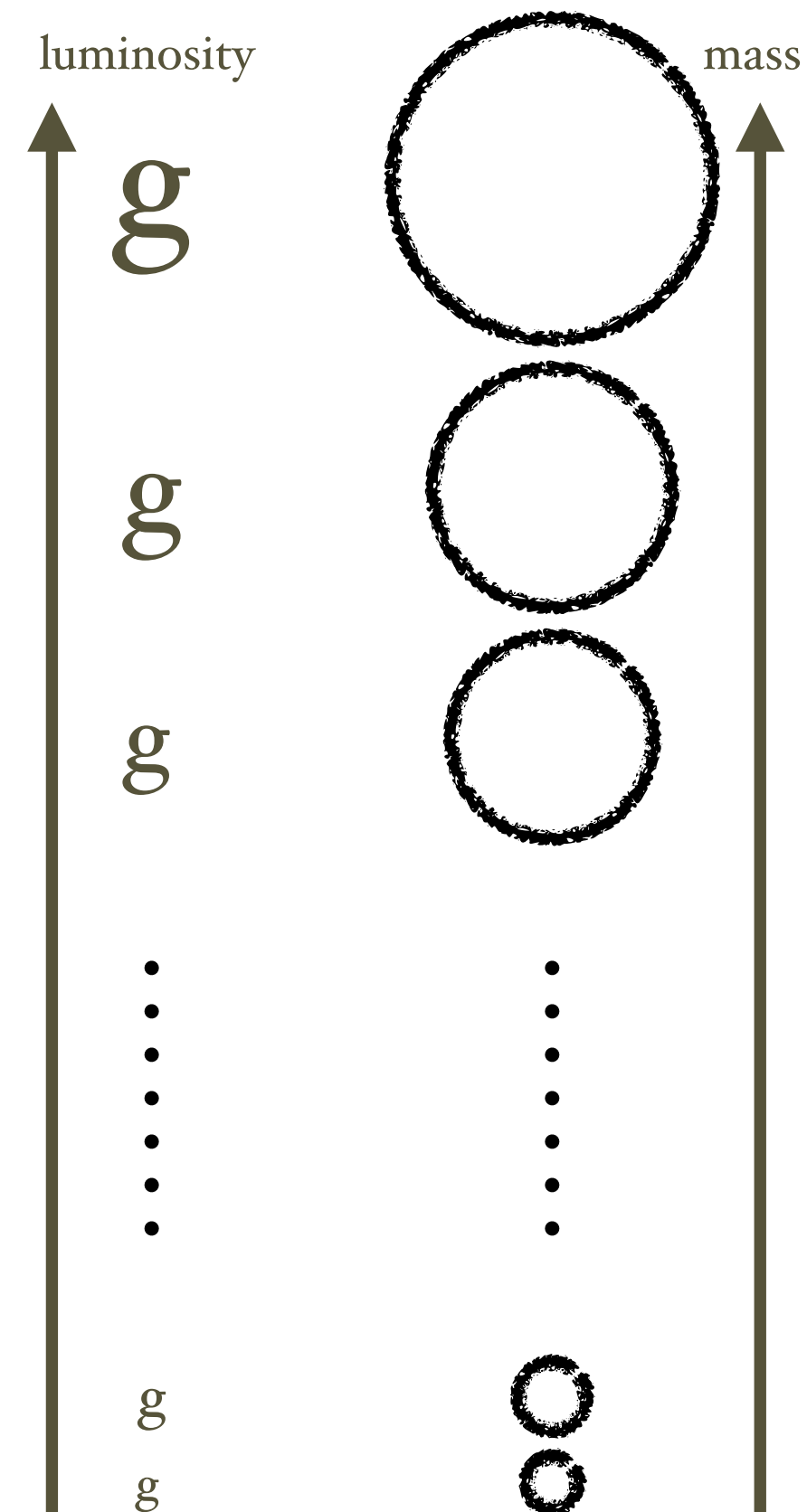
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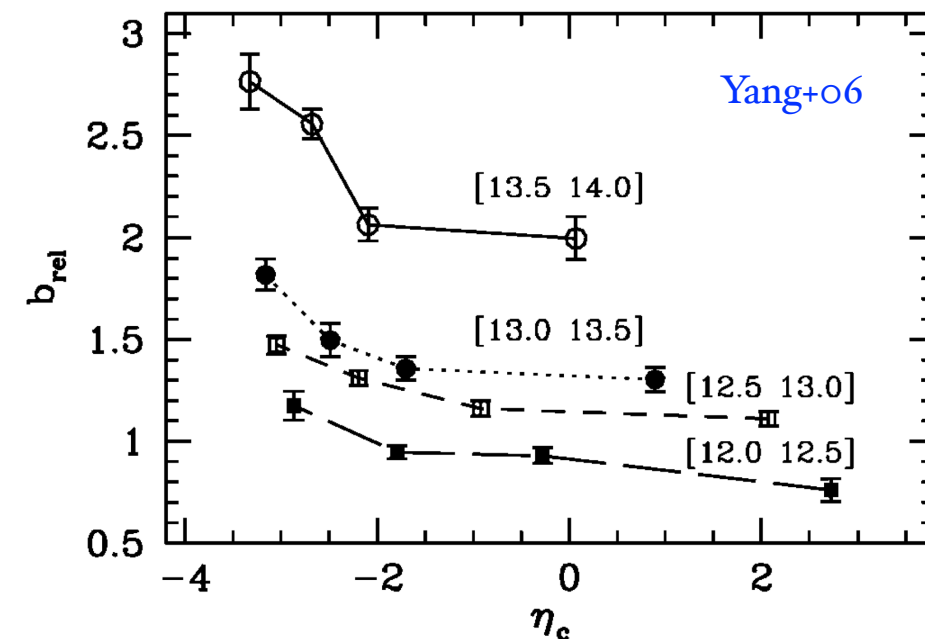
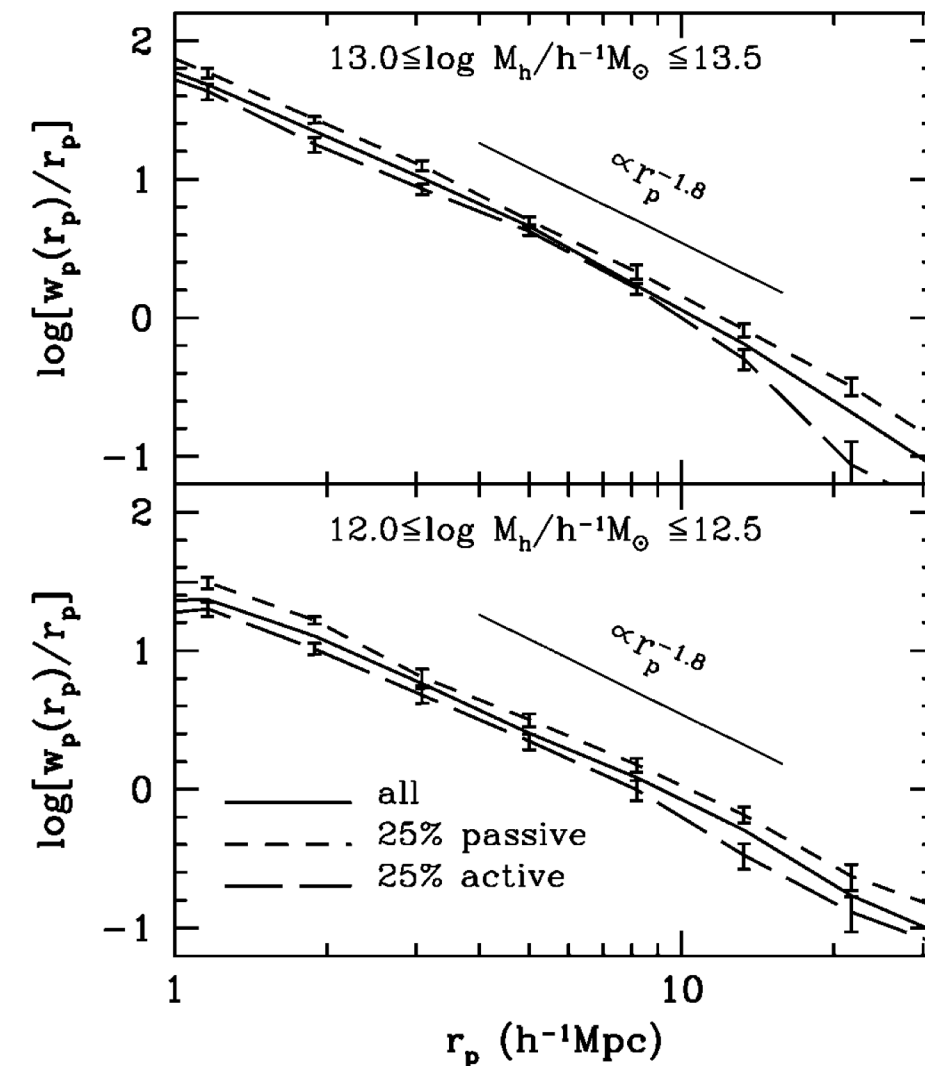
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- formation history of central galaxies *assumed* to be closely related to that of the halos
- Yang+06 found that halos with currently passive centrals have larger bias than those with star-forming centrals of the *same* halo mass
  - if passive  $\leftrightarrow$  old, star-forming  $\leftrightarrow$  young, then this indicated assembly bias



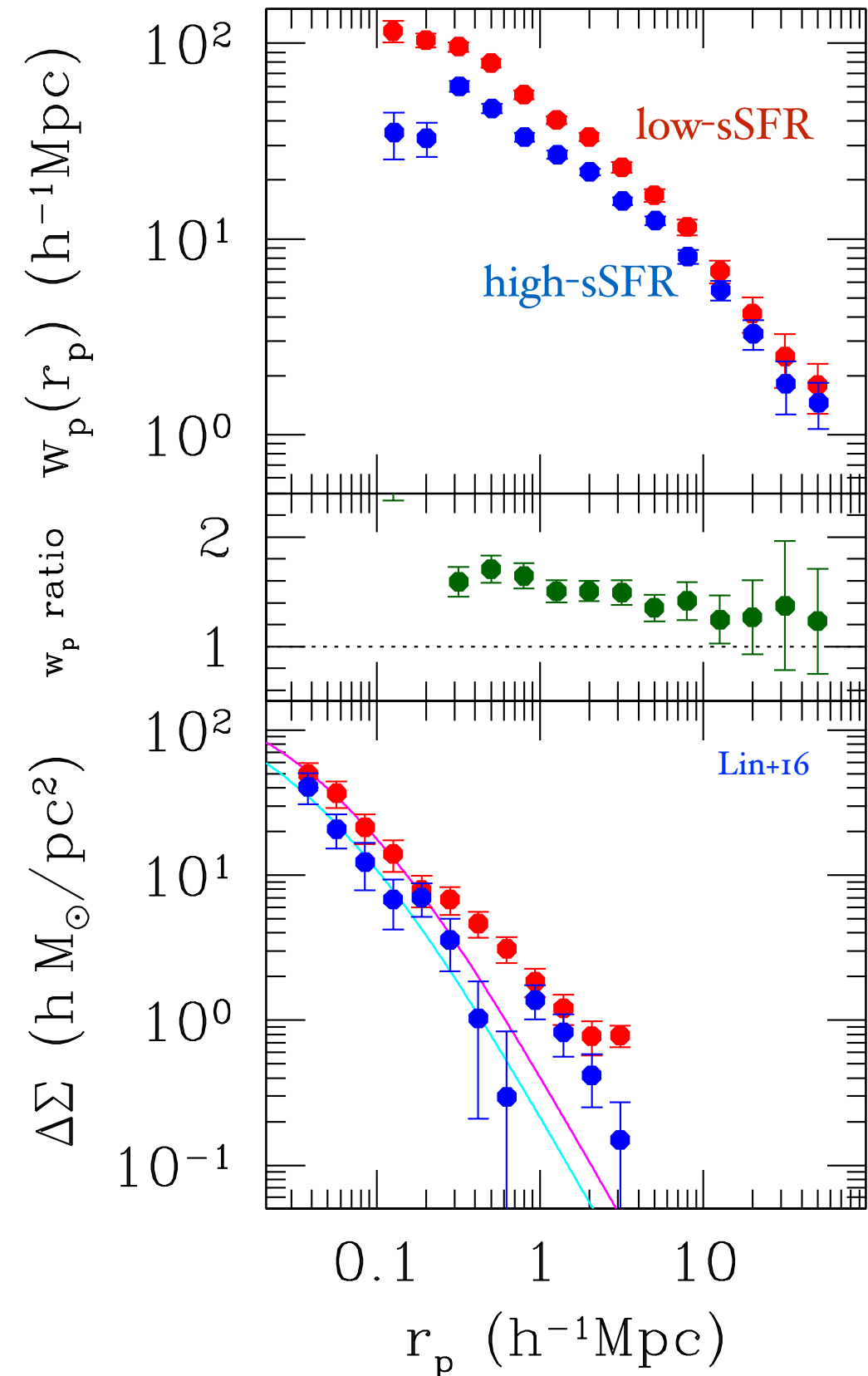
# wasn't this detected long ago?

- Yang+06 first claimed detection
  - a catalog that classifies galaxies into single and multiple galactic systems
  - designation of central vs satellite galaxies
  - halo mass *assigned* to each system à la abundance matching technique
- formation history of central galaxies *assumed* to be closely related to that of the halos
- Yang+06 found that halos with currently passive centrals have larger bias than those with star-forming centrals of the *same* halo mass
  - if passive  $\leftrightarrow$  old, star-forming  $\leftrightarrow$  young, then this indicated assembly bias



# or was it?

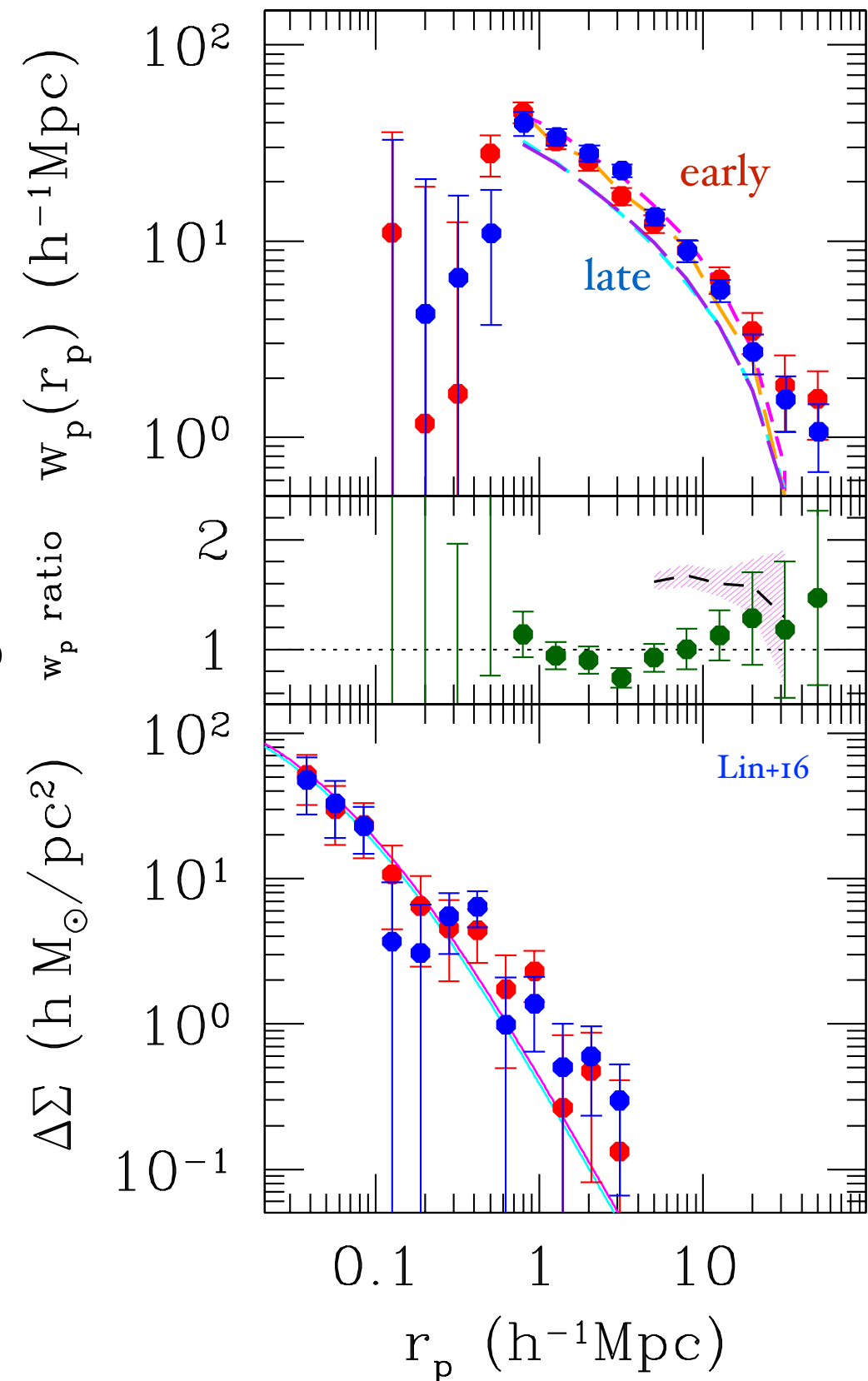
- using SDSS data, we follow the Yang+06 approach and confirm that low-sSFR centrals do cluster more strongly than high-sSFR ones sSFR=specific star formation rate
- only central galaxies are used
- however, the difference in bias may be explained by the difference in the mean masses of the two samples, as indicated by stacked weak lensing
- the previous claim of detection likely false
- Yang et al. halo mass assignment not reliable (at such low mass scales)
- serious contamination from satellite galaxies also seen





# non-detection of assembly bias *in Milky Way-like halos*

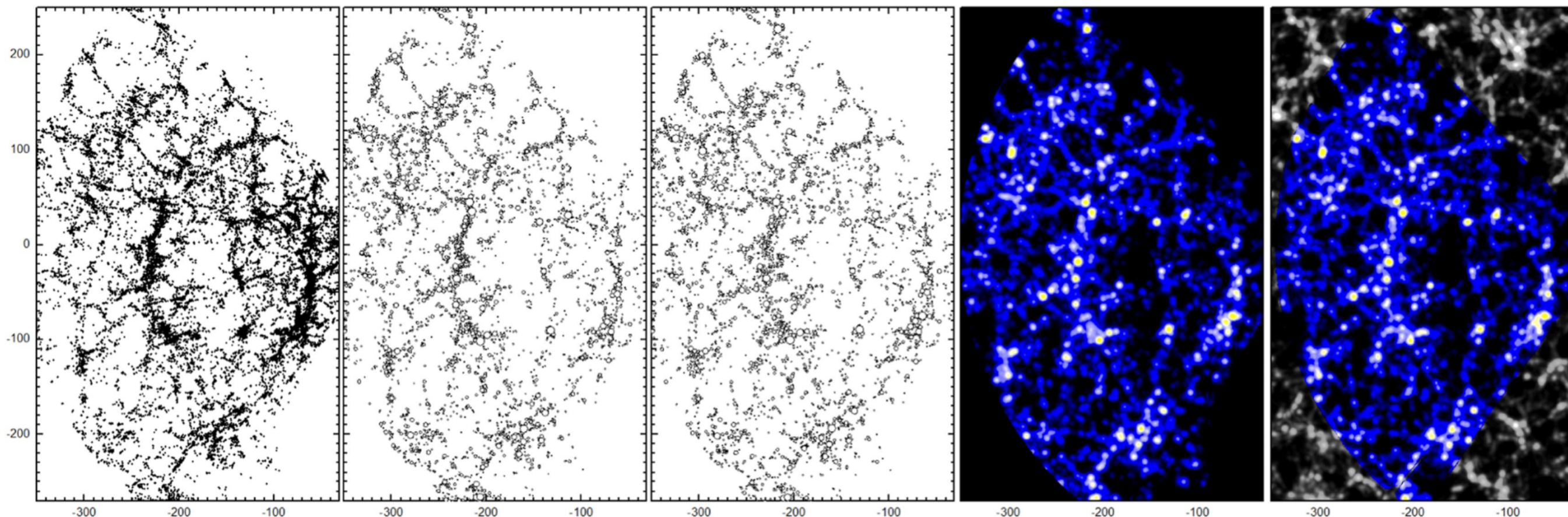
- we have constructed a pair of early- and late-forming central samples (selected by star formation history) for which the satellite contamination is minimal
- masses are  $(9 \pm 2) \times 10^{11} h^{-1} M_{\text{sun}}$  and  $(8 \pm 2) \times 10^{11} h^{-1} M_{\text{sun}}$
- theoretical expectation derived from high resolution N-body simulations, taking into account uncertainties in halo mass distribution
  - log-normal form assumed
  - probable values of centroid & width allowed by measured lensing signal
- probability for theory to be consistent with observation is  $2 \times 10^{-6}$



# assembly bias at cluster scales?

- what is the best proxy/indicator for the halo formation time?
- concentration may work, but difficult to measure in practice
- what if we have the mass accretion history (MAH) of the clusters?
- using the group catalog of Yang et al., H.-Y. Wang et al. (2016) have run a constrained simulation (CS) of the local Universe (SDSS DR7,  $z < 0.12$ ) called *Elucid*

Wang+16

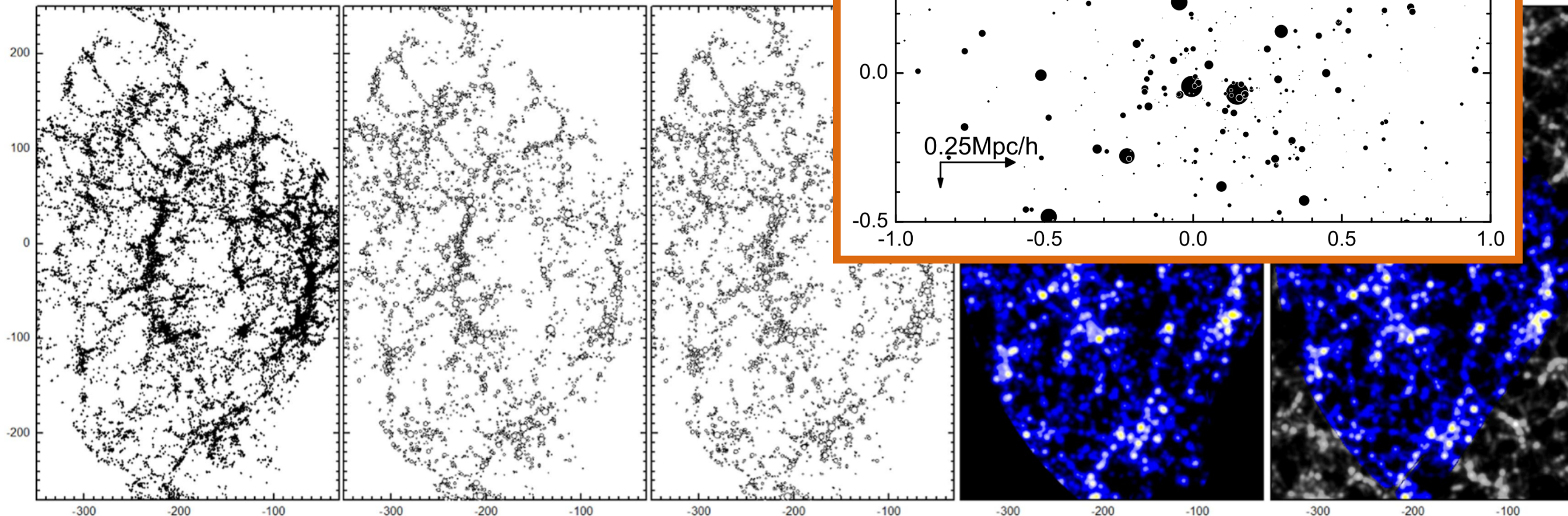




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- for structures larger than  $\sim 2 \text{ Mpc/h}$ , there is very good correspondence between SDSS LSS and Elucid structures
- we have selected top 600 most massive clusters at  $z < 0.12$  from Yang's catalog
- MAH for each cluster is given by the counterpart halo in Elucid



# conclusion

- it remains a puzzle as to why the total stellar mass–cluster mass relation does not evolve with time
  - should include intracluster light in the measurements of “total” stellar mass
  - should measure this relation in bins of optical richness at several redshifts, to really constrain the (no-)evolution
- HSC data is great for a wide array of topics in galaxy/cluster formation and cosmology
  - stay tuned for the next public data release (May 2019)!
- forward-modeling techniques have great potential for understanding galaxy/cluster formation (assembly bias, splashback radius, stellar mass–cluster mass relation, etc)
  - extending such approaches to high- $z$  (from DESI, PFS, Euclid?) would be exciting!