



Weak lensing masses and  
scaling relations for 100 clusters

Kavli IPMU  
May 13 2019

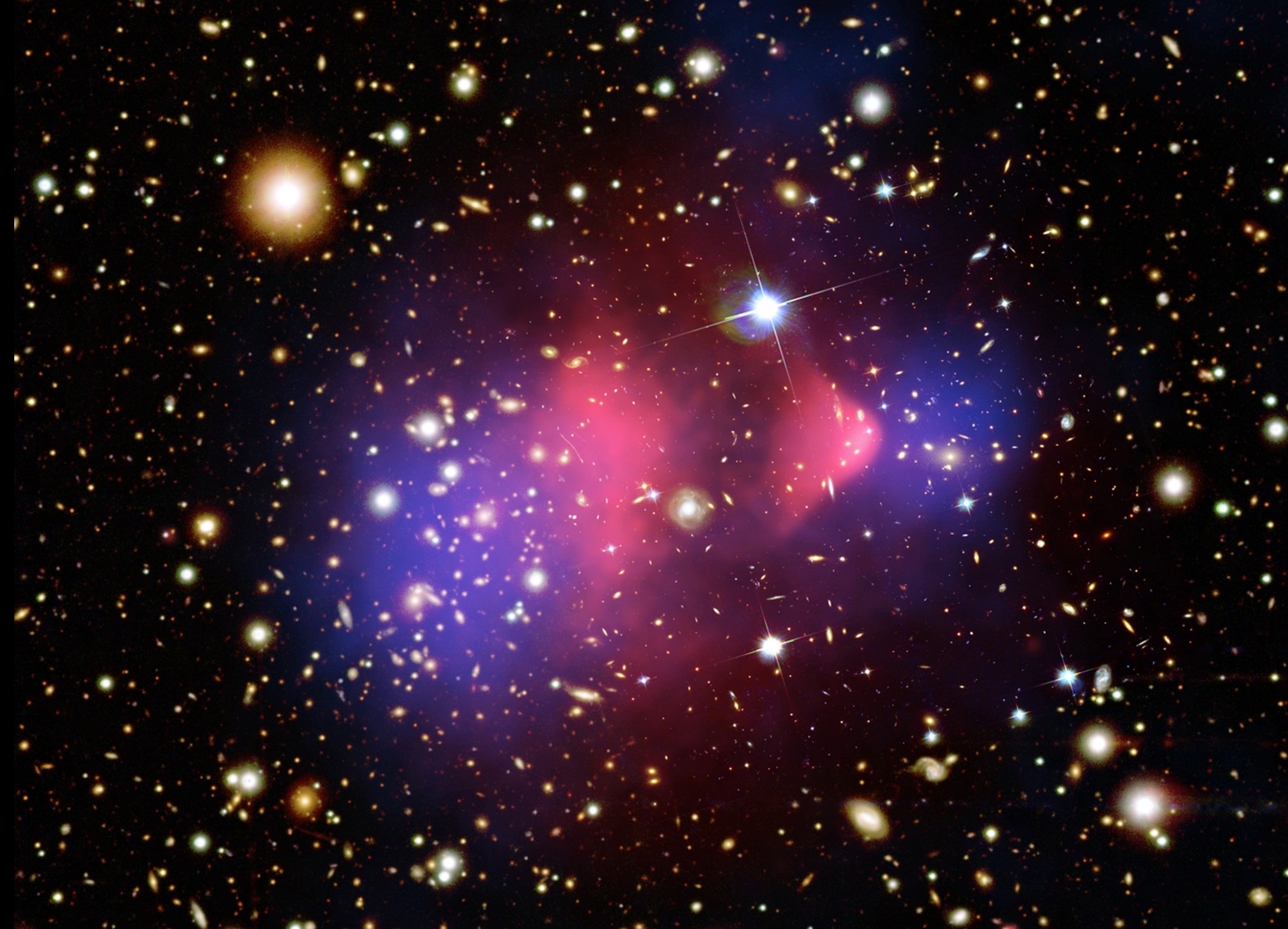
UNVEILING DARK STRUCTURES WITH ACCURATE WEAK LENSING

Ricardo Tian Long Herbonnet

UNVEILING  
DARK STRUCTURES  
WITH ACCURATE  
WEAK LENSING

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## Bullet cluster

~18%

Hot X-ray emitting  
intracluster gas

~2%

Mostly red and  
dead galaxies

~80%

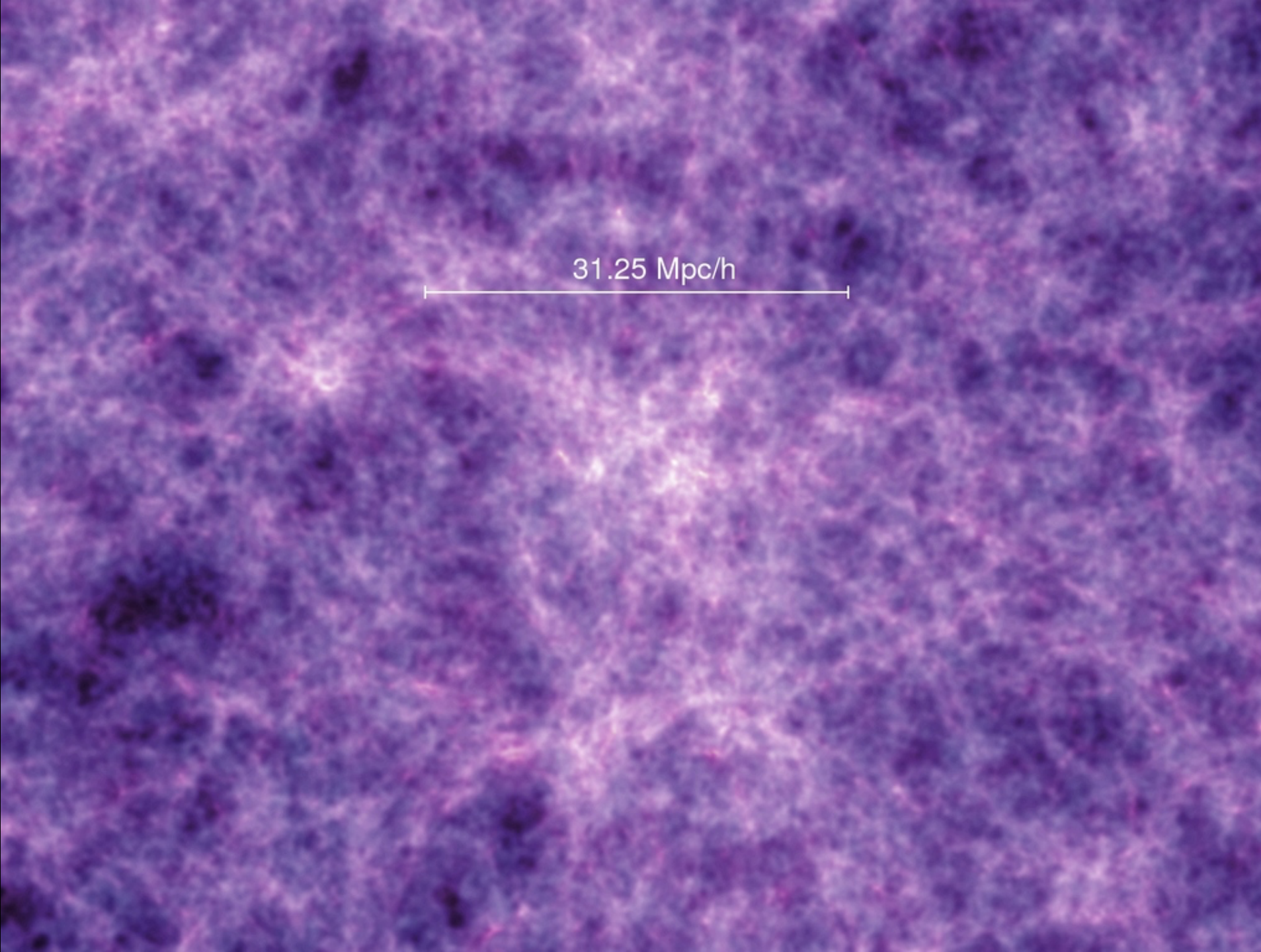
Dark matter  
Weak gravitational  
lensing



# How do galaxy clusters form?

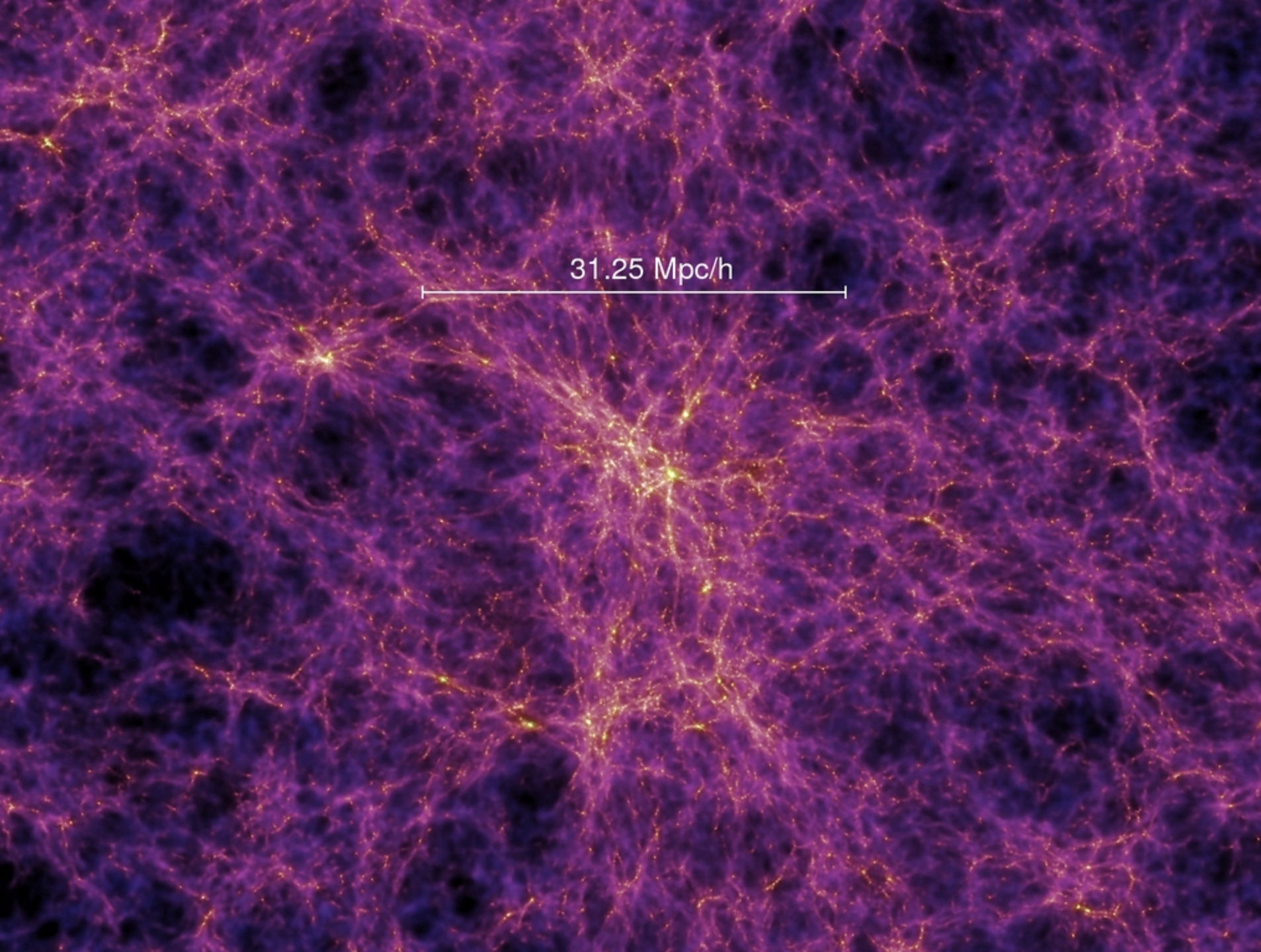
Millennium Simulation

(Dark) matter is distributed isotropic and homogenous in the early Universe with random fluctuations



Springel et al. (2005)

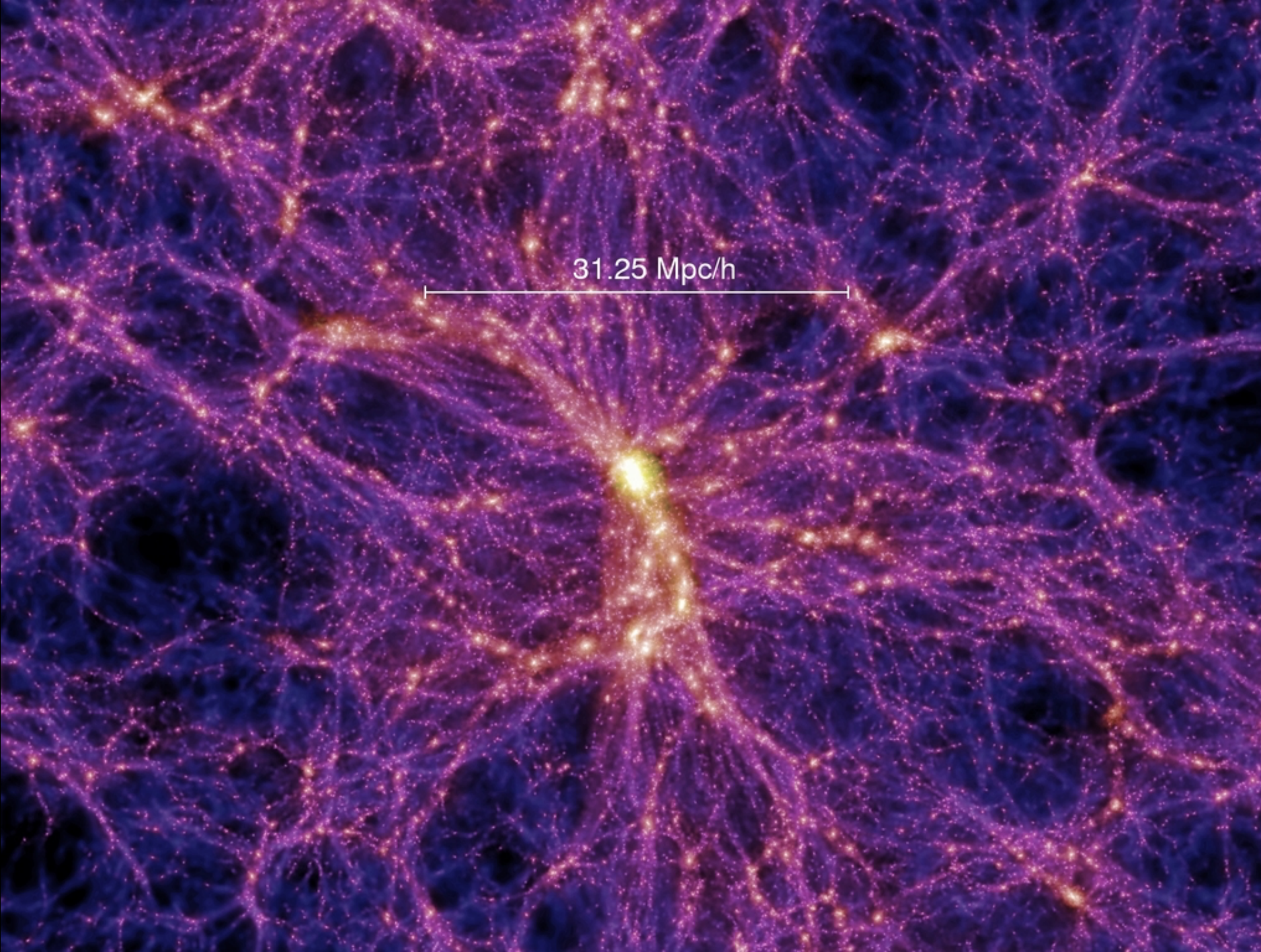




As time progresses  
matter coalesces under  
the influence of gravity

Springel et al. (2005)



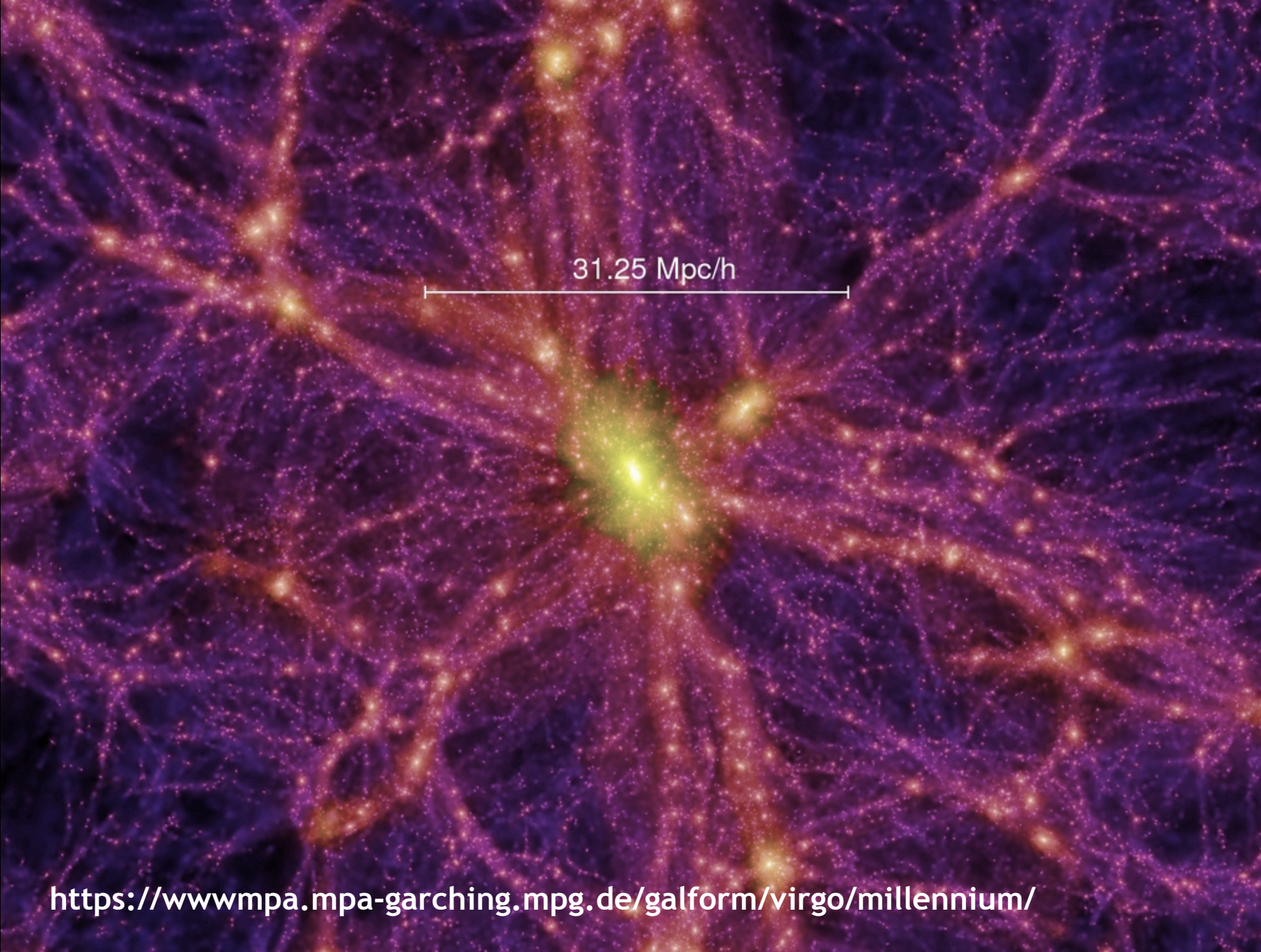


Halo of dark matter  
form connected by long  
filaments of matter

Meanwhile, dark energy  
pulls the entire Universe  
apart, impeding the  
growth of halo

Springel et al. (2005)

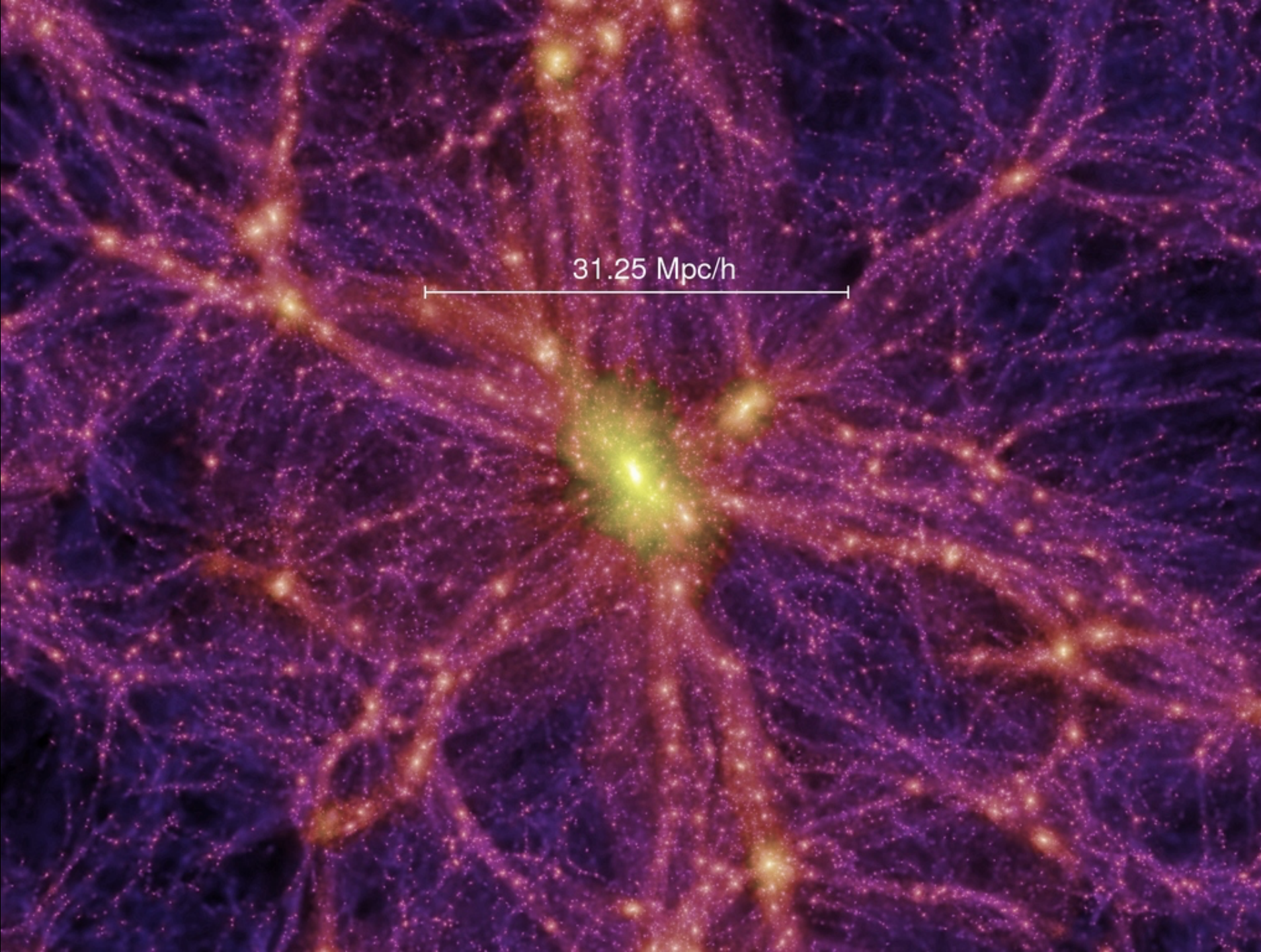




Light emitting matter, attracted by the gravitational pull of dark matter haloes, follow the distribution set by the dark matter filaments

In the center a galaxy cluster is formed





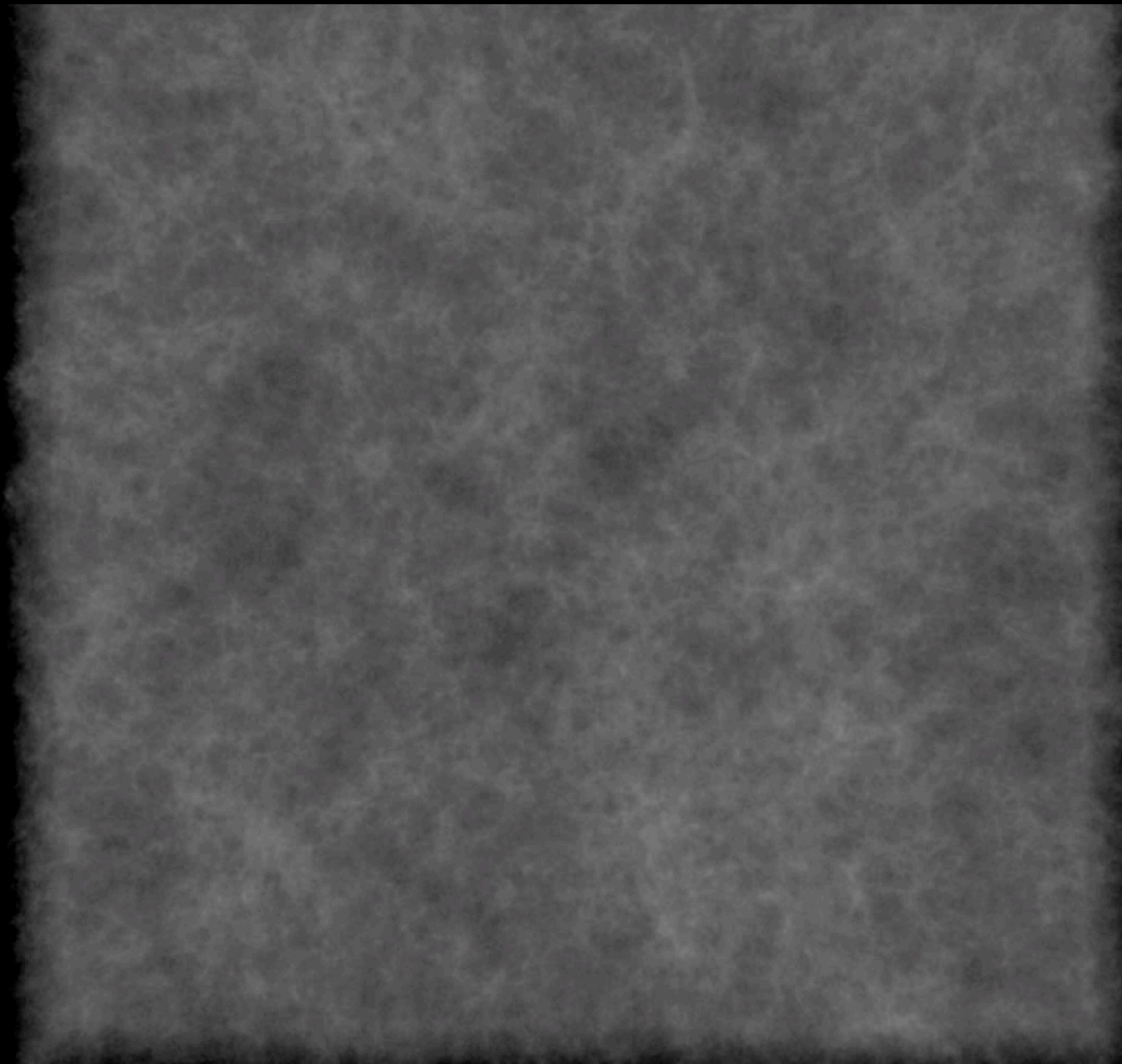
Given the large region which collapses to form a galaxy cluster, clusters are thought to have a similar composition to the entire Universe.

Measuring the dark matter mass and the mass in standard model particles in clusters determines the total dark matter content of the Universe.

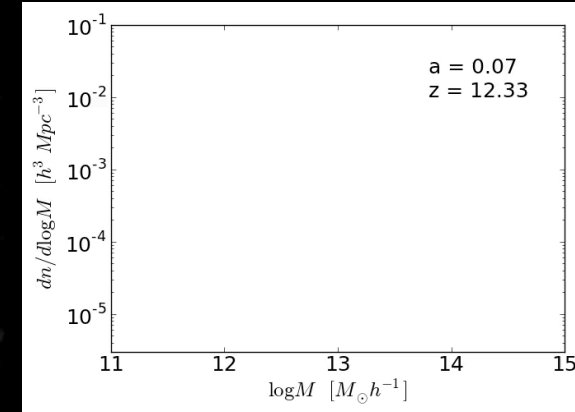
$$\left(\frac{M^{\text{SM}}}{M^{\text{DM}}}\right)_{\text{cluster}} = \left(\frac{M^{\text{SM}}}{M^{\text{DM}}}\right)_{\text{Universe}}$$



# Counting Halos



## halo mass function



- ▶ number of gravitationally bound halos sensitive to cosmological model
- ▶ both *geometry* (volume) and *growth of structure* (evolution of mass function)

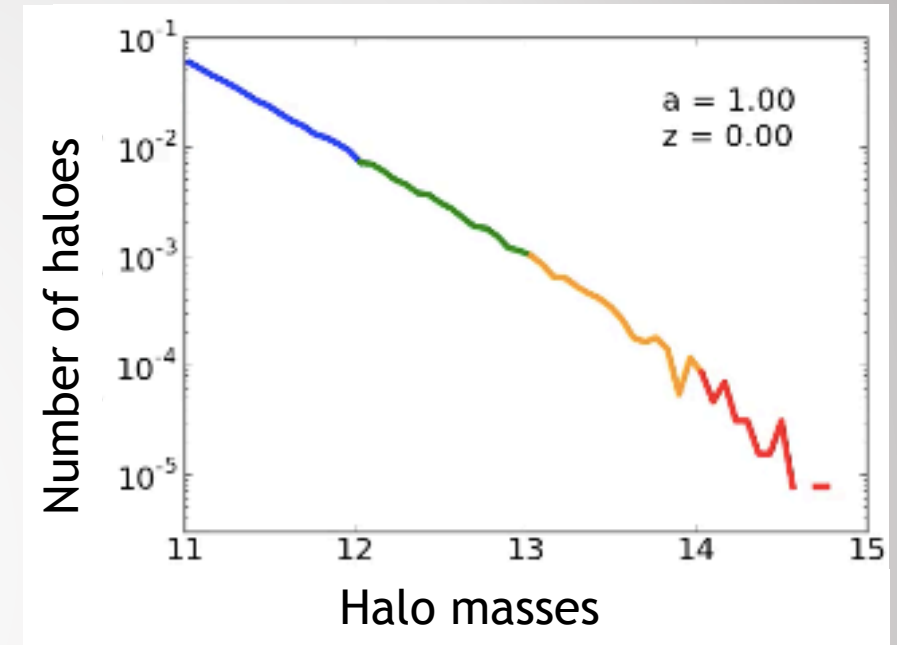


# Cluster number counts

Observationally constraining the halo mass function

**Galaxy clusters** are rare and powerful probes

- Detect galaxy clusters
  - Sunyaev-Zeldovich effect in Planck, ACT, SPT
  - Extended X-ray sources in ROSAT, Chandra, XMM
  - Optical overdensities of (red) galaxies: redmapper, CAMIRA, ...
- Scaling relation between observable and halo mass
  - Detection based on baryonic matter not easily linked to halo mass
  - Empirical relation between baryonic observable and halo mass
  - Measuring halo masses → **Weak gravitational lensing**





# Weak lensing cluster sample

## MENeaCS

Multi Epoch Nearby Cluster Survey

Most X-ray luminous clusters in the local Universe

~50 galaxy clusters  
 $0.05 < z < 0.15$      $M_{200} > 10^{14} M_{\odot}$

deep  $r$  band CFHT observations  
seeing  $< 0.8''$      $20 < m_r < 24.5$

## CCCP

Canadian Cluster Comparison Project

Hoekstra et al. 2012

Hoekstra, Herbonnet et al. 2015

~50 galaxy clusters  
 $0.15 < z < 0.55$      $M_{200} > 3 \times 10^{14} M_{\odot}$

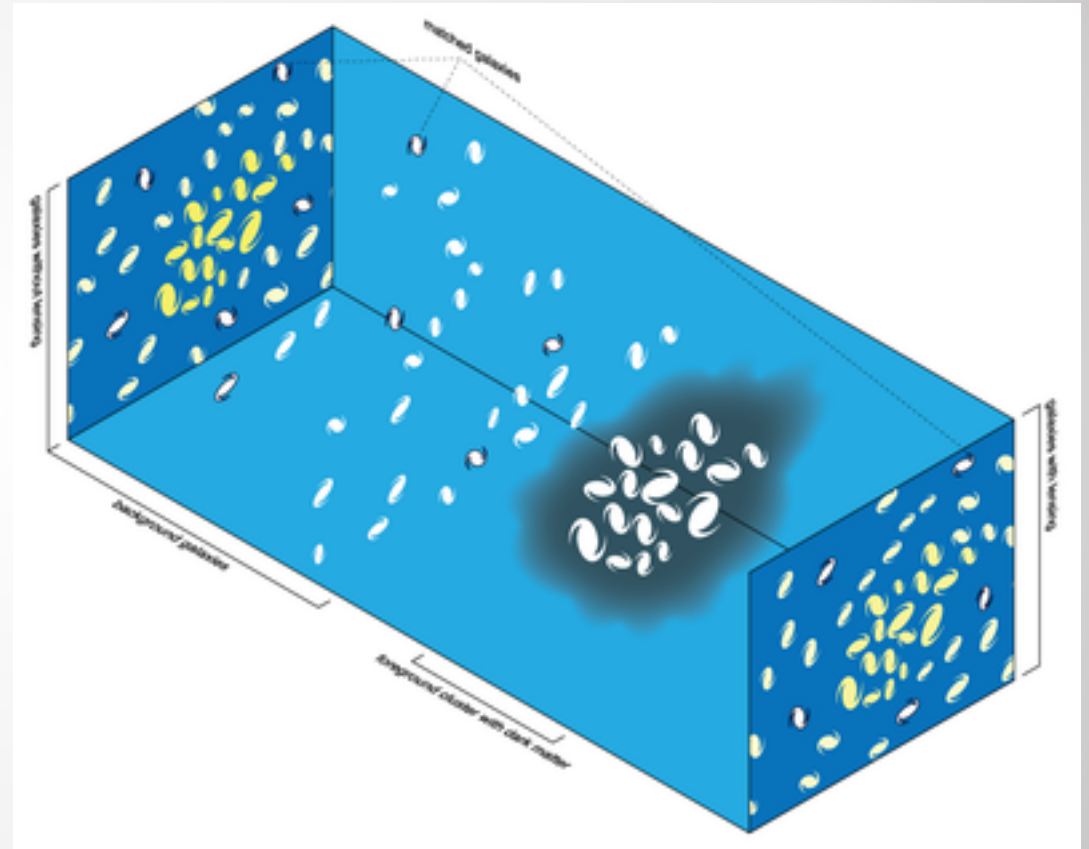
deep  $r$  band CFHT observations  
seeing  $< 0.9''$      $22 < m_r < 25$



# Steps in cluster weak lensing

- Shear measurement
- Photometric redshift distribution
- Source galaxy selection
- Mass determination

Unfortunately each step of the process introduces uncertainty and error

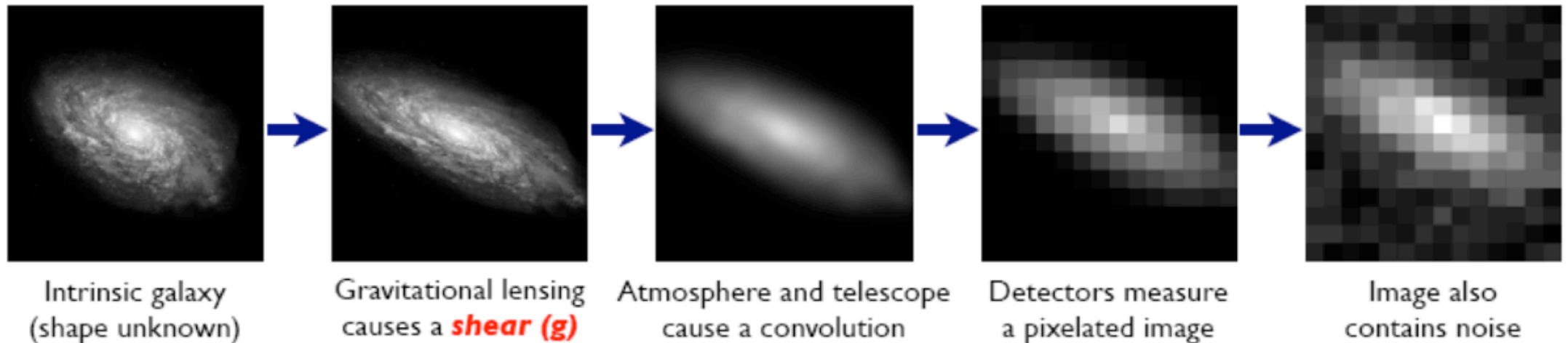




# Steps in cluster weak lensing

- Shear measurement
- Photometric redshift distribution
- Source galaxy selection
- Mass determination

$$g^{est} \approx \Sigma_{gal} (\overset{\sim 0.3}{\epsilon^{int}} + \overset{\sim 0.01}{g^{true}}) / N_{gal}$$





# Steps in cluster weak lensing

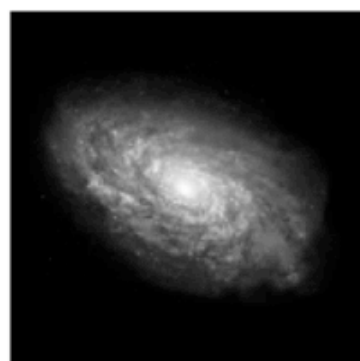
- Shear measurement
- Photometric redshift distribution
- Source galaxy selection
- Mass determination

Calibrate shear measurement algorithm  
with extensive image simulations

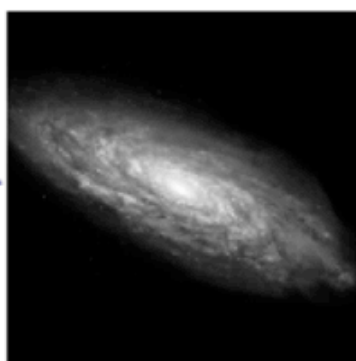
Hoekstra, Herbonnet et al. 2015

Corrected for the effect of cluster galaxies

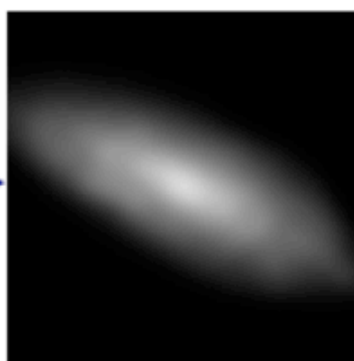
Sifon, Herbonnet et al. 2017



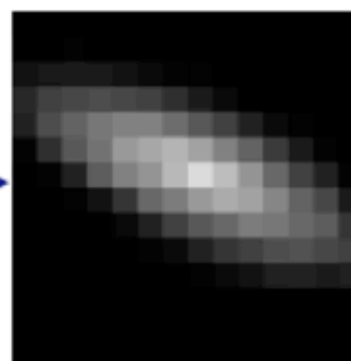
Intrinsic galaxy  
(shape unknown)



Gravitational lensing  
causes a **shear (g)**



Atmosphere and telescope  
cause a convolution



Detectors measure  
a pixelated image

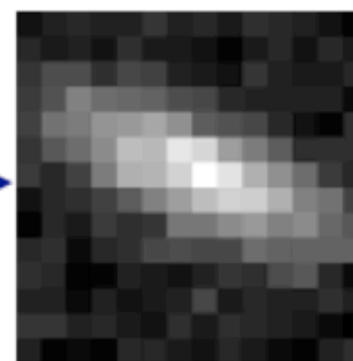


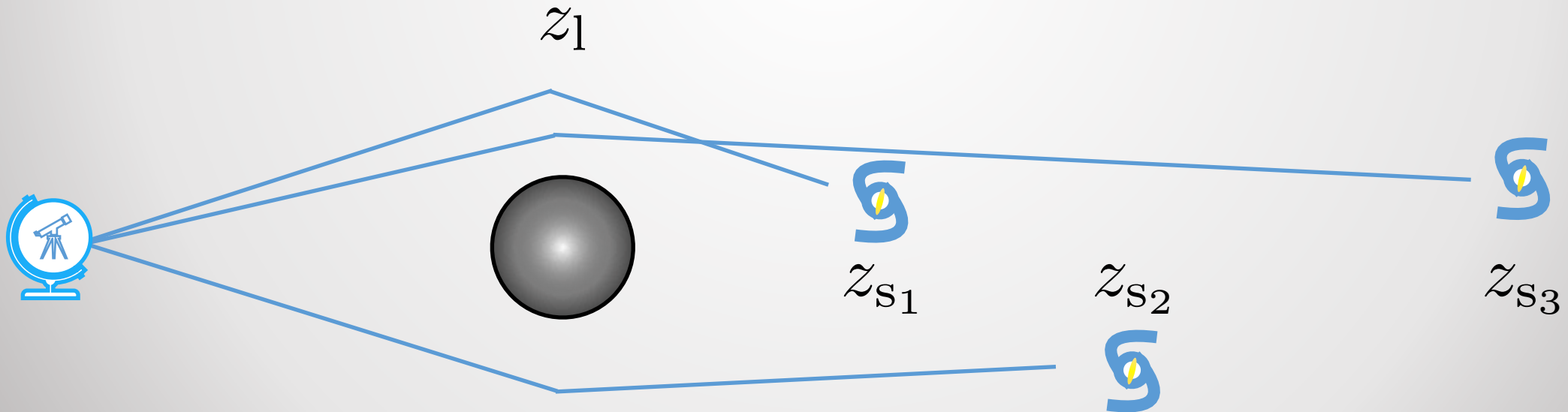
Image also  
contains noise

Bridle et al. 2008

# Steps in cluster weak lensing

- Shear measurement
- Photometric redshift distribution
- Source galaxy selection
- Mass determination

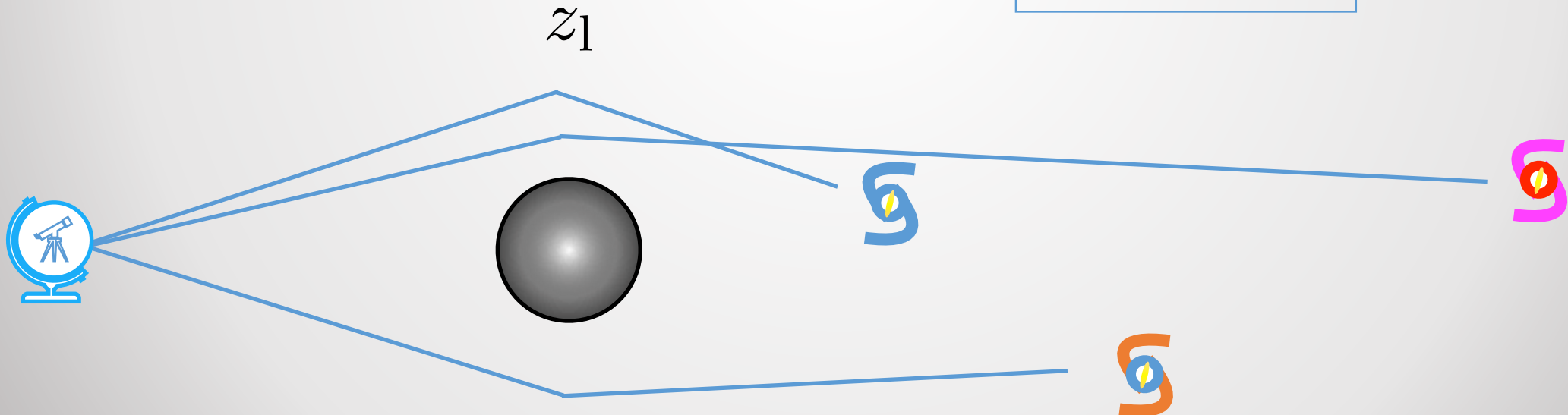
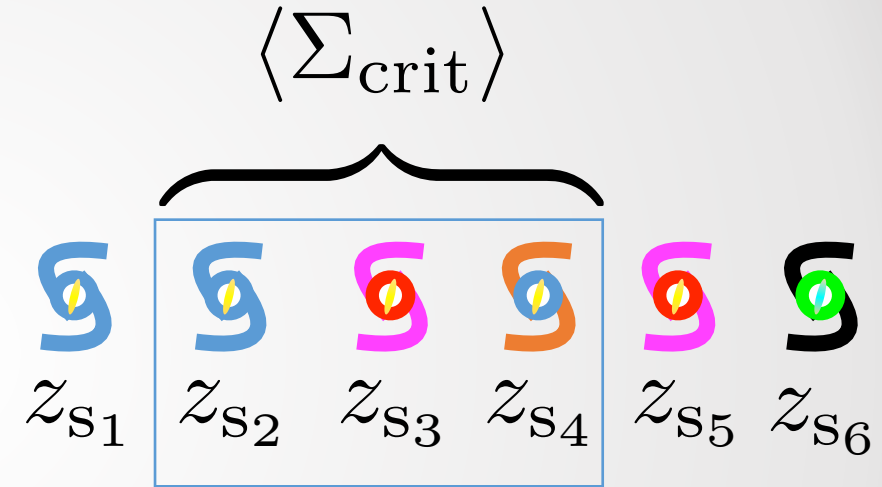
$$\Sigma_{\text{crit}} = \frac{c^2}{4\pi G} \frac{D(0, z_s)}{D(z_1, z_s) D(0, z_1)}$$





# Steps in cluster weak lensing

- Shear measurement
- Photometric redshift distribution
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# Photometric redshift distribution

COSMOS2015 Laigle et al. 2016

2 sq. deg. 30+ filter photometry

1 sq. deg. lensing measurements

Matched COSMOS catalogue to  
lensing catalogue to mimic each  
cluster observation

1 sq. deg. for  $\langle \Sigma_{\text{crit}} \rangle$  measurement

1 sq. deg. for Poisson errors <3%

CFHT Deep fields Ilbert et al. 2006  
~4 sq. deg. 5 filter photometry

Cosmic variance <3%

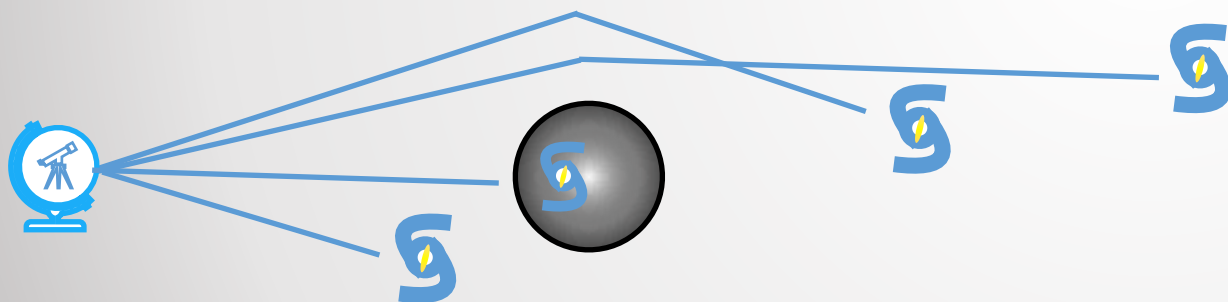
UltraVista DR3 Muzzin in prep.  
~0.73 sq. deg. 50+ filter photometry

Comparison of different  
photo-z codes <1%

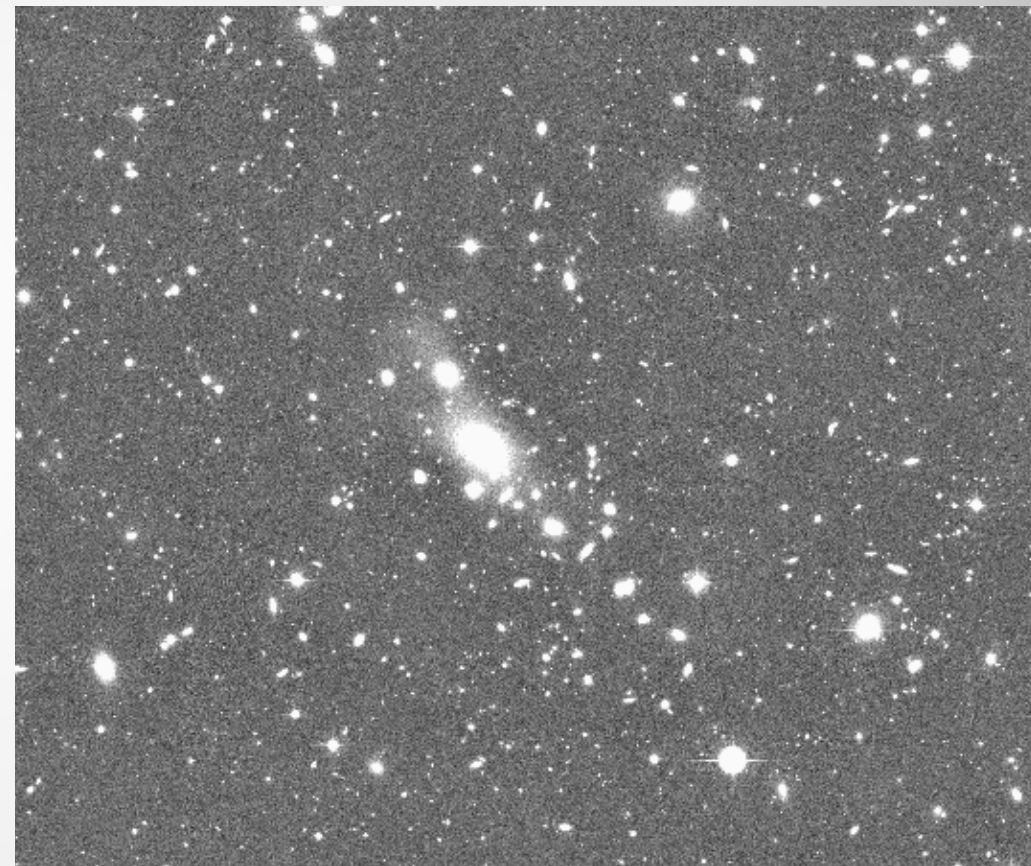


# Steps in cluster weak lensing

- Shear measurement
- Photometric redshift distribution
- **Source galaxy selection**
- Mass determination



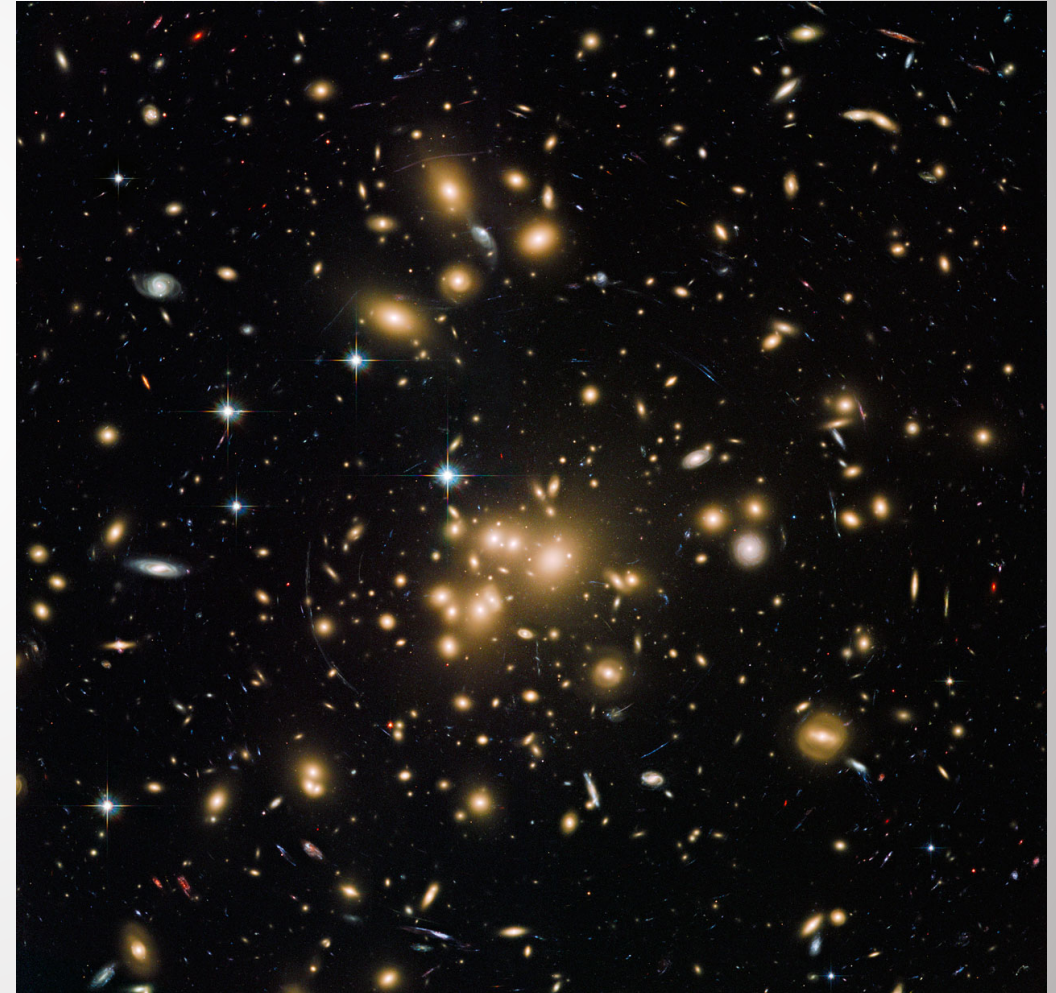
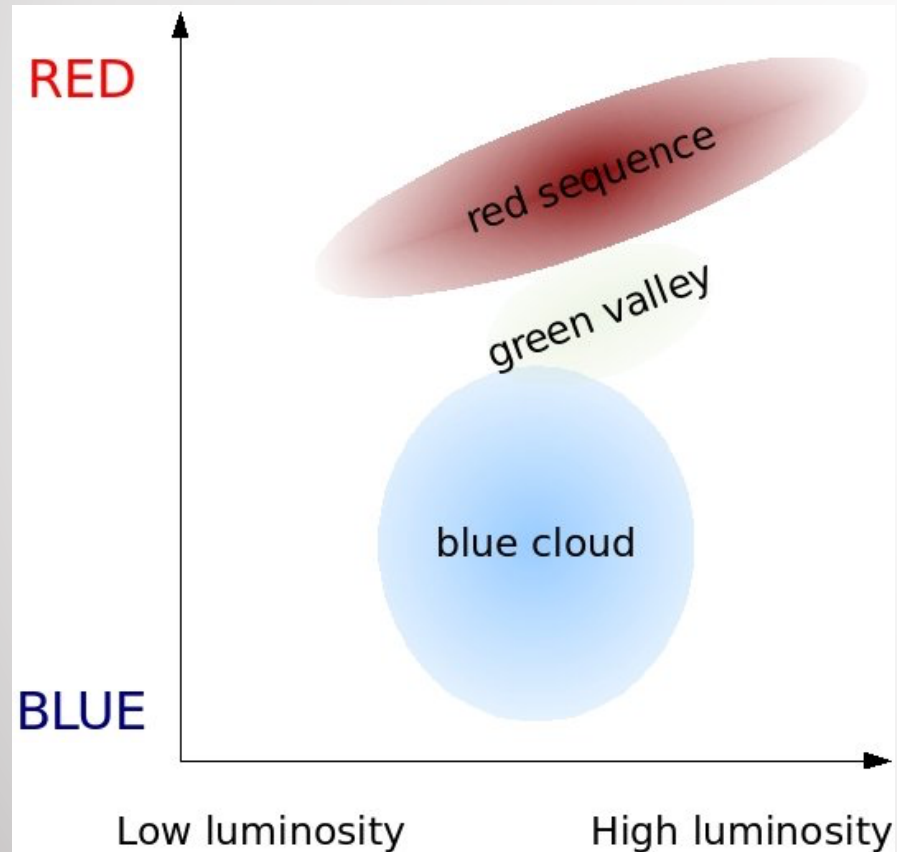
Only galaxies behind the cluster carry lensing signal  
Adding other galaxies dilutes the lensing signal



Which galaxies are behind the cluster?

# Colour-based selection of cluster members

Remove red sequence in cluster fields



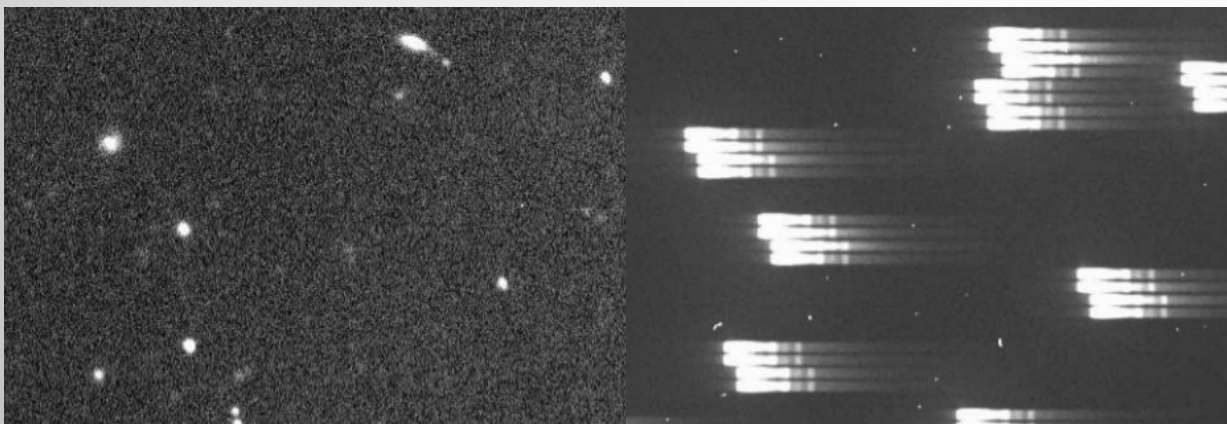


# Accurate redshifts for cluster lensing

Lensing requires large numbers of (faint) galaxies

With low resolution spectra ( $R \sim 20-60$ )  
many objects can be imaged simultaneously

Combination of short spectra and photometry can  
increase the accuracy of redshift estimates

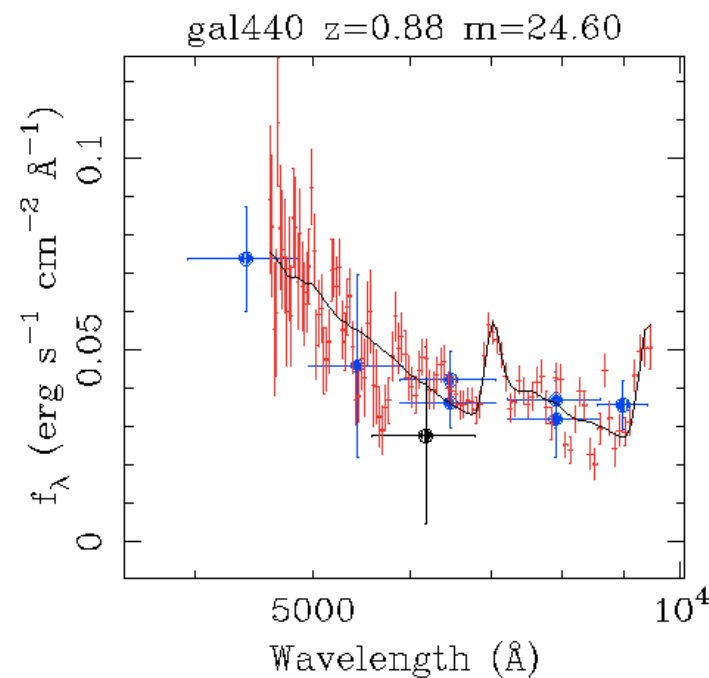


PRIMUS Coil et al. 2012

Pilot study with IMACS at Magellan

Clusters MACS0454 and RXJ2248

Galaxies down to 25th magnitude



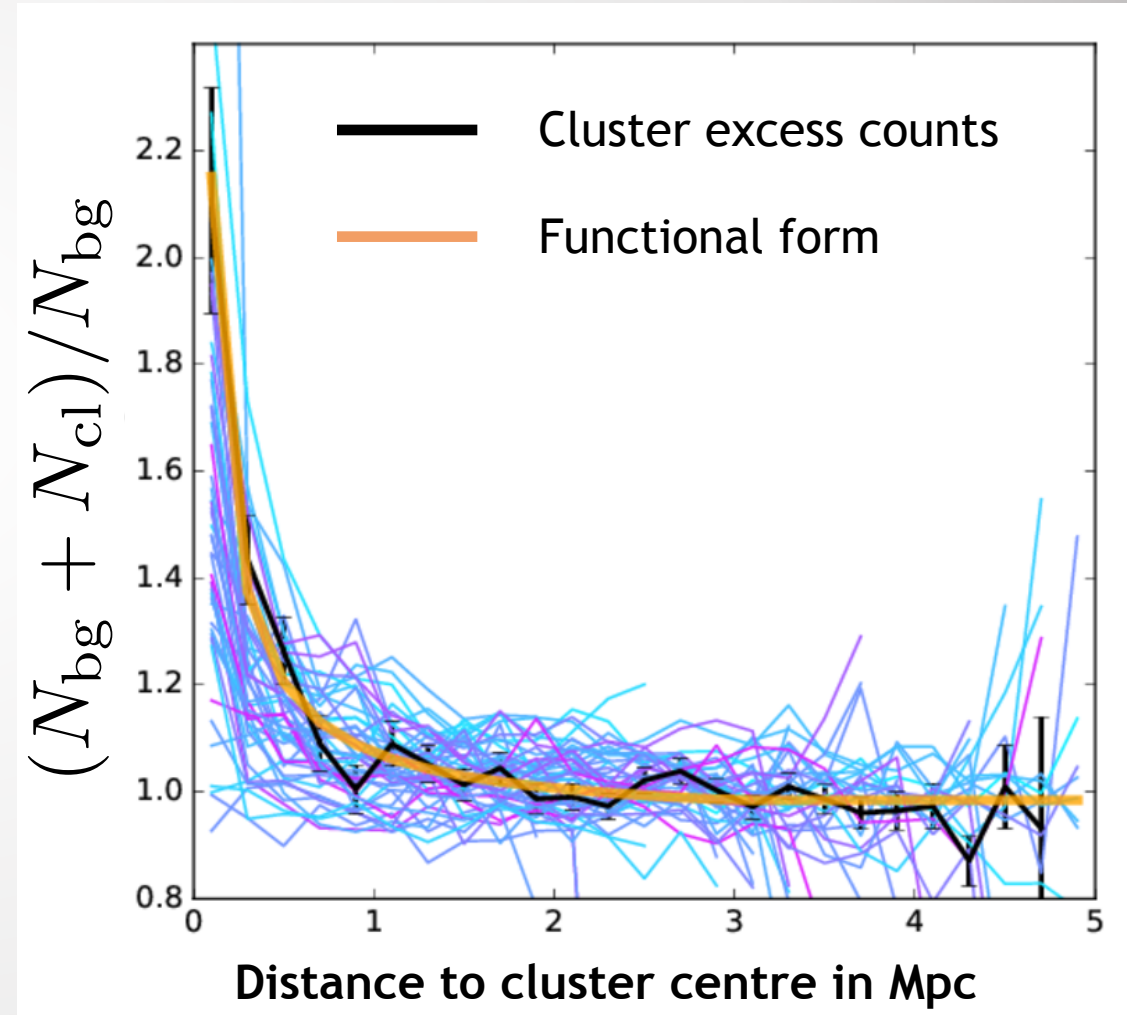
Preliminary result

# Contamination by cluster members

Contamination of the source sample lowers the shear signal proportional to the number of cluster galaxies

Measure the fraction of cluster galaxies to correct for contamination

Fit a functional form to individual clusters with which to boost their shear signal





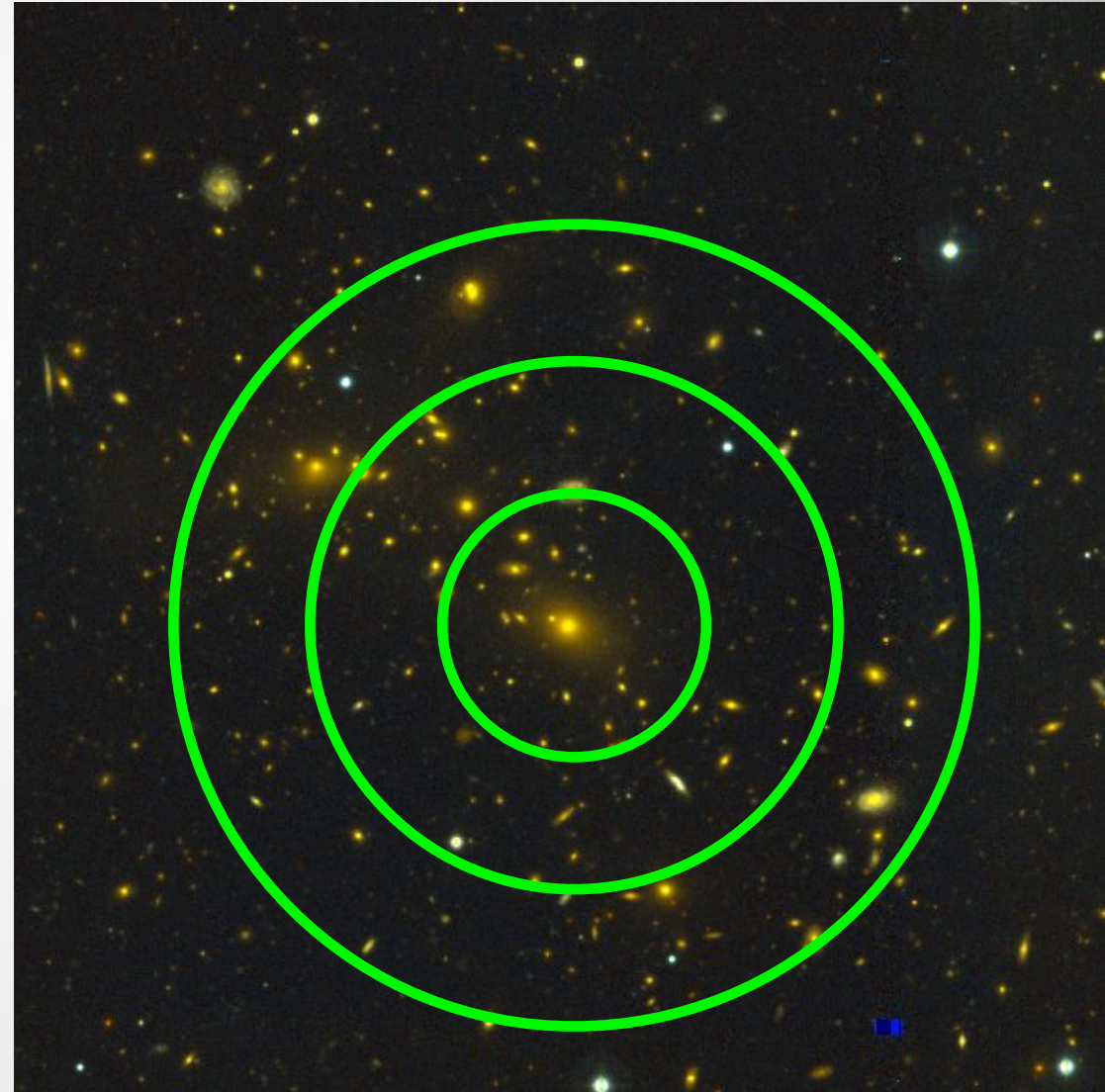
# Steps in cluster weak lensing

- Shear measurement
- Photometric redshift distribution
- Source galaxy selection
- Mass determination

## Cluster centre:

brightest cluster galaxy  
centre of the X-ray profile

Agree on centre for our sample



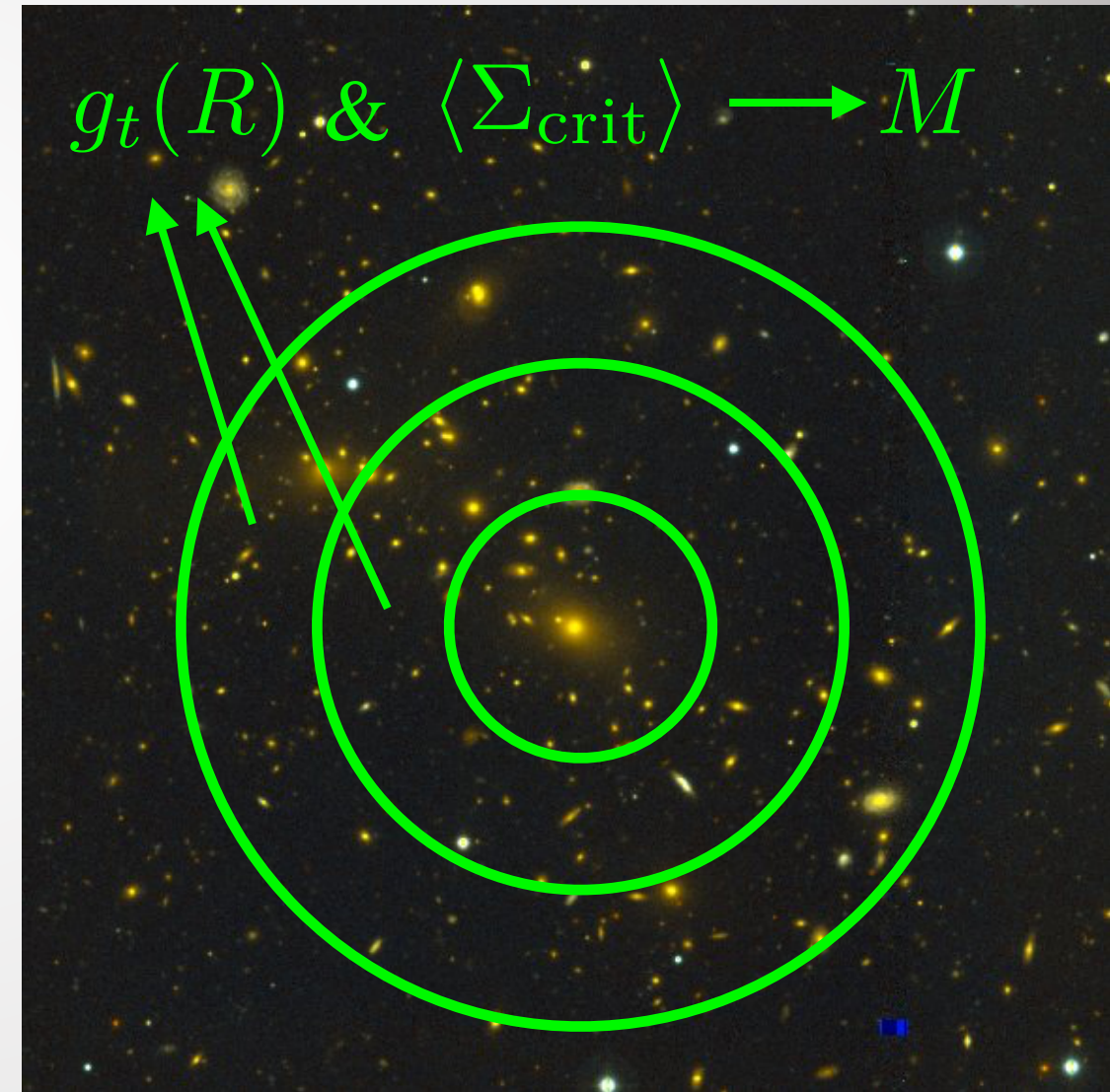
# Steps in cluster weak lensing

- Shear measurement
- Photometric redshift distribution
- Source galaxy selection
- **Mass determination**

Mass modelling:  
Fit a spherical NFW density profile

Mass distribution of dark matter haloes determined from numerical simulations

Fits well to the data on average for certain regions of the haloes





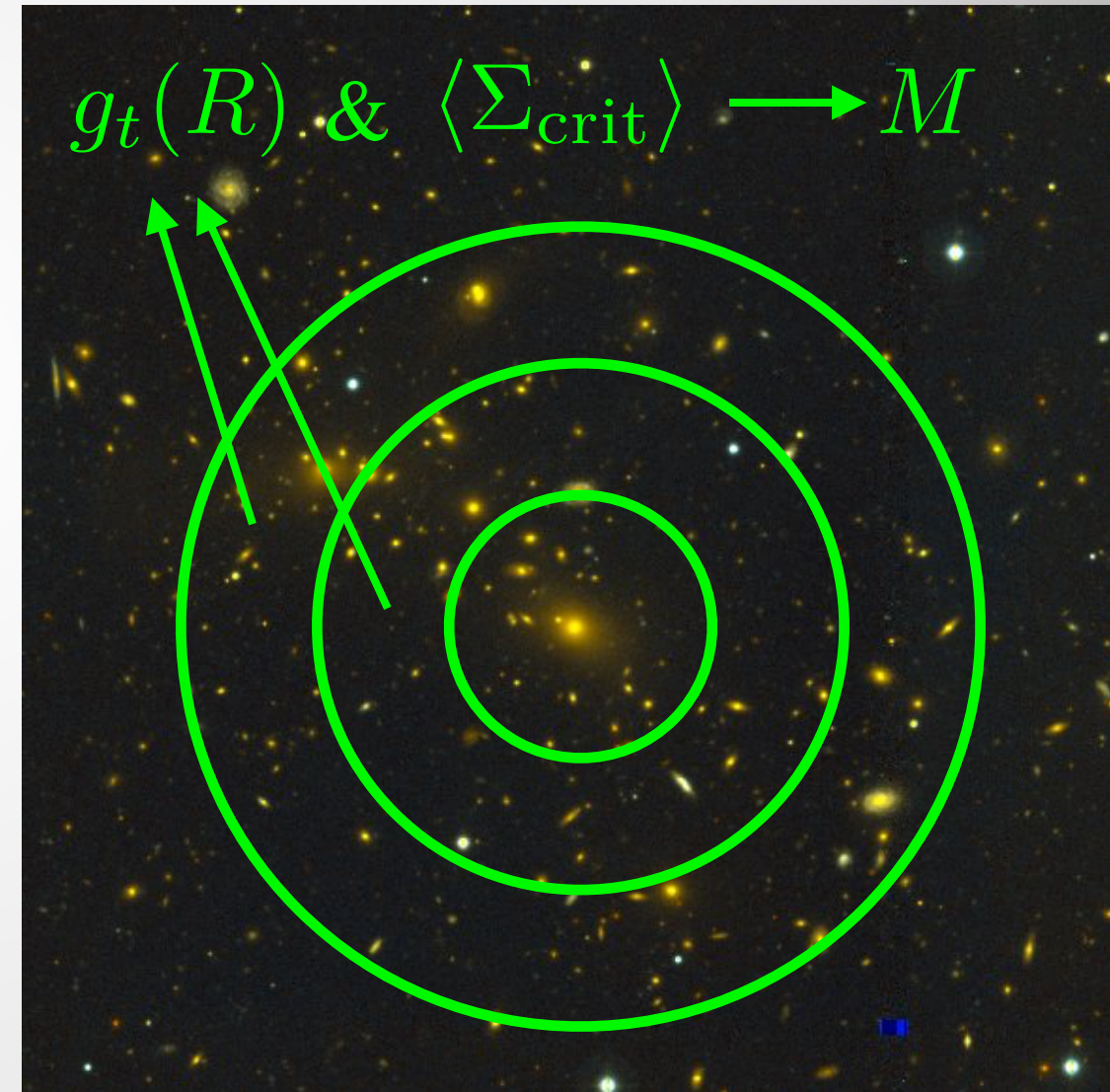
# Steps in cluster weak lensing

- Shear measurement
- Photometric redshift distribution
- Source galaxy selection
- **Mass determination**

Mass modelling:  
Deprojected aperture masses

Compute 2D mass in an aperture based on assumption on convergence profile

Compute 3D mass by assuming an NFW mass distribution along the line of sight



# Mass determination

## Aperture mass

Projected average surface density

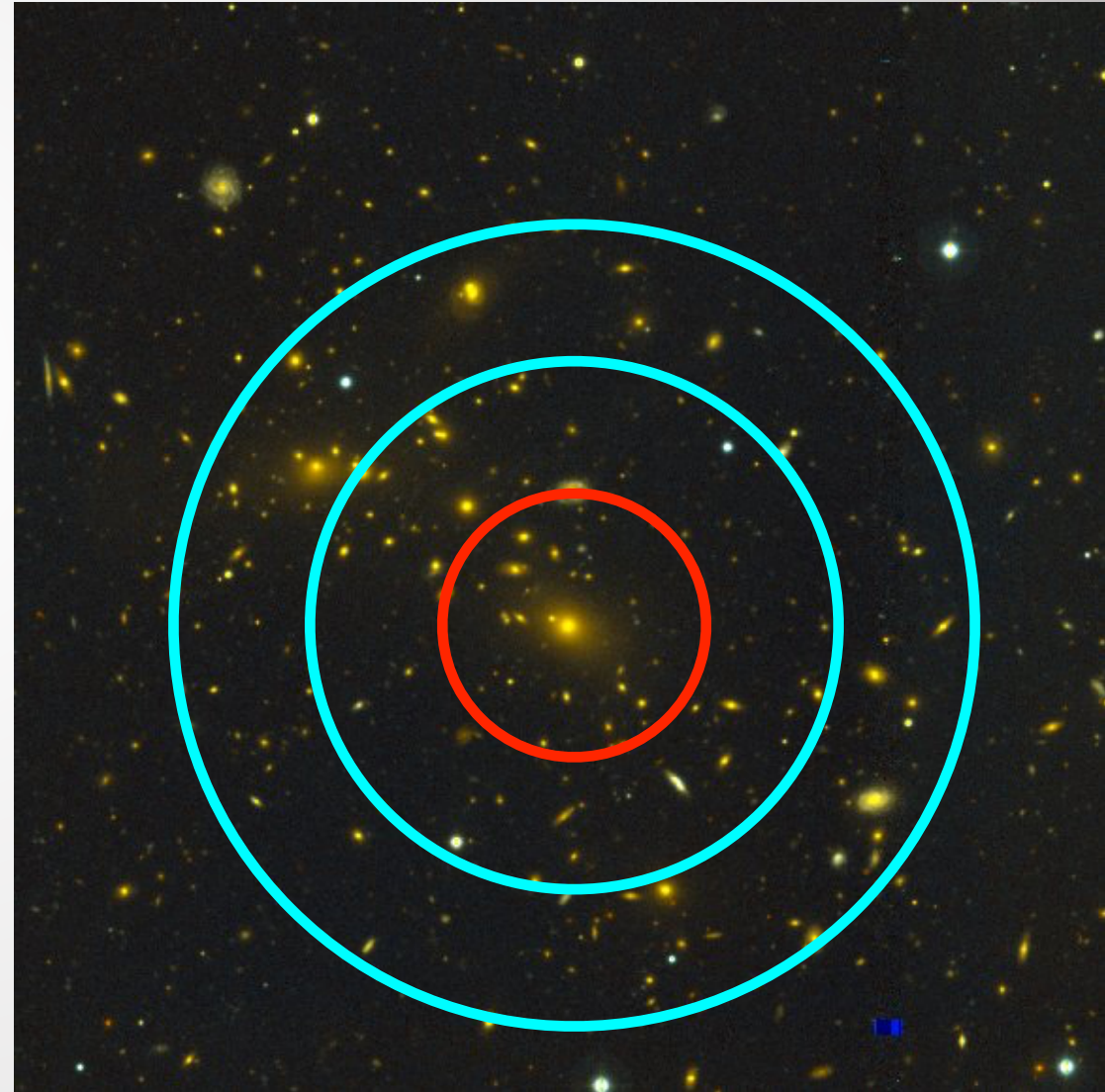
Projected average density in annulus

$$\overline{\kappa}(r \leq r_1) - \overline{\kappa}(r_2 < r \leq r_{\max}) =$$

$$2 \int_{r_1}^{r_2} \langle \gamma_t \rangle d \ln r + \\ 2(1 - r_2^2/r_{\max}^2)^{-1} \int_{r_2}^{r_{\max}} \langle \gamma_t \rangle d \ln r$$

Compute from shear measurements

Deproject assuming NFW along the line of sight





# Mass determination

## Comparison between mass estimators

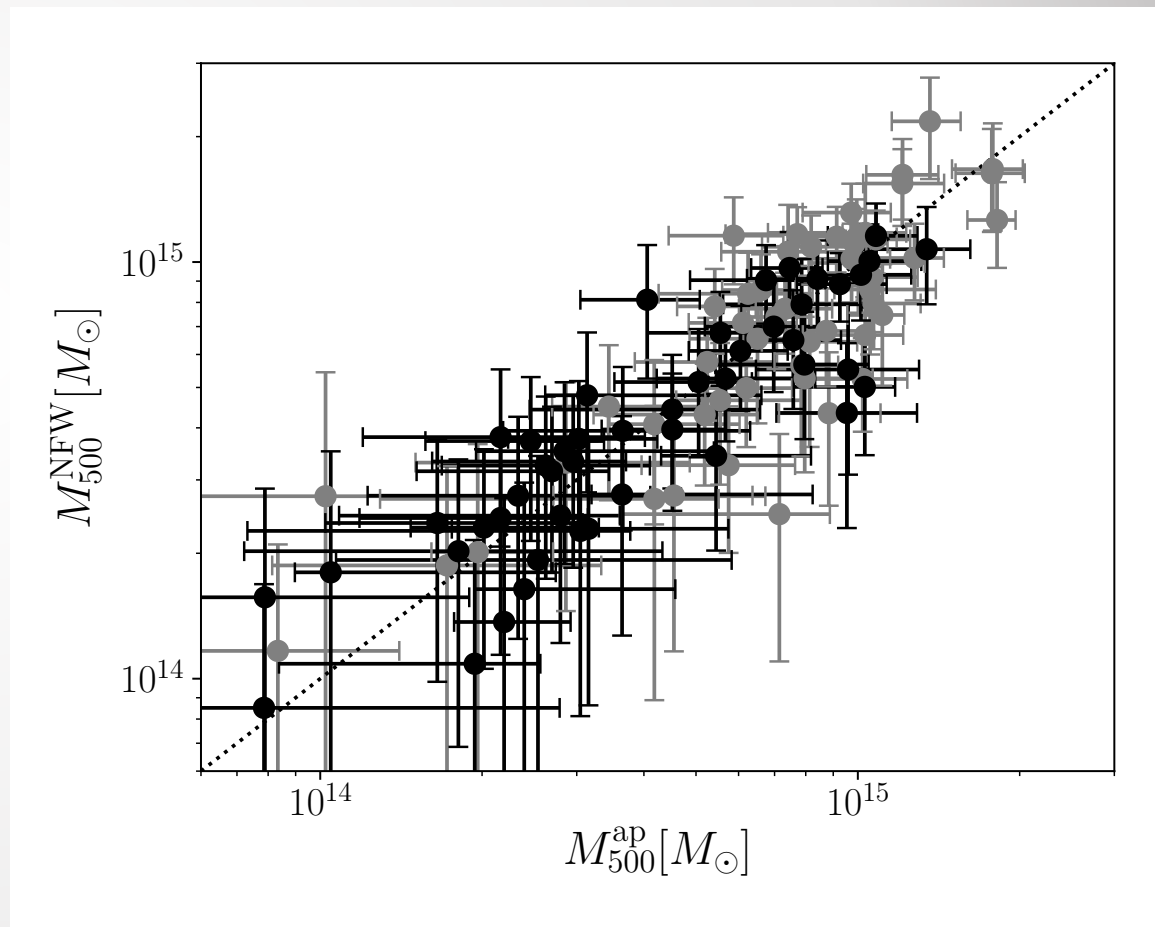
Good agreement between deprojected aperture masses and NFW masses at  $M_{500}$

### Fit ranges:

NFW determined between 0.5 — ~2 Mpc

Aperture masses determined from  $>\sim 1$  Mpc

Confidence that mass estimates are reliable



# Mass determination

## Assess on realistic simulations of clusters

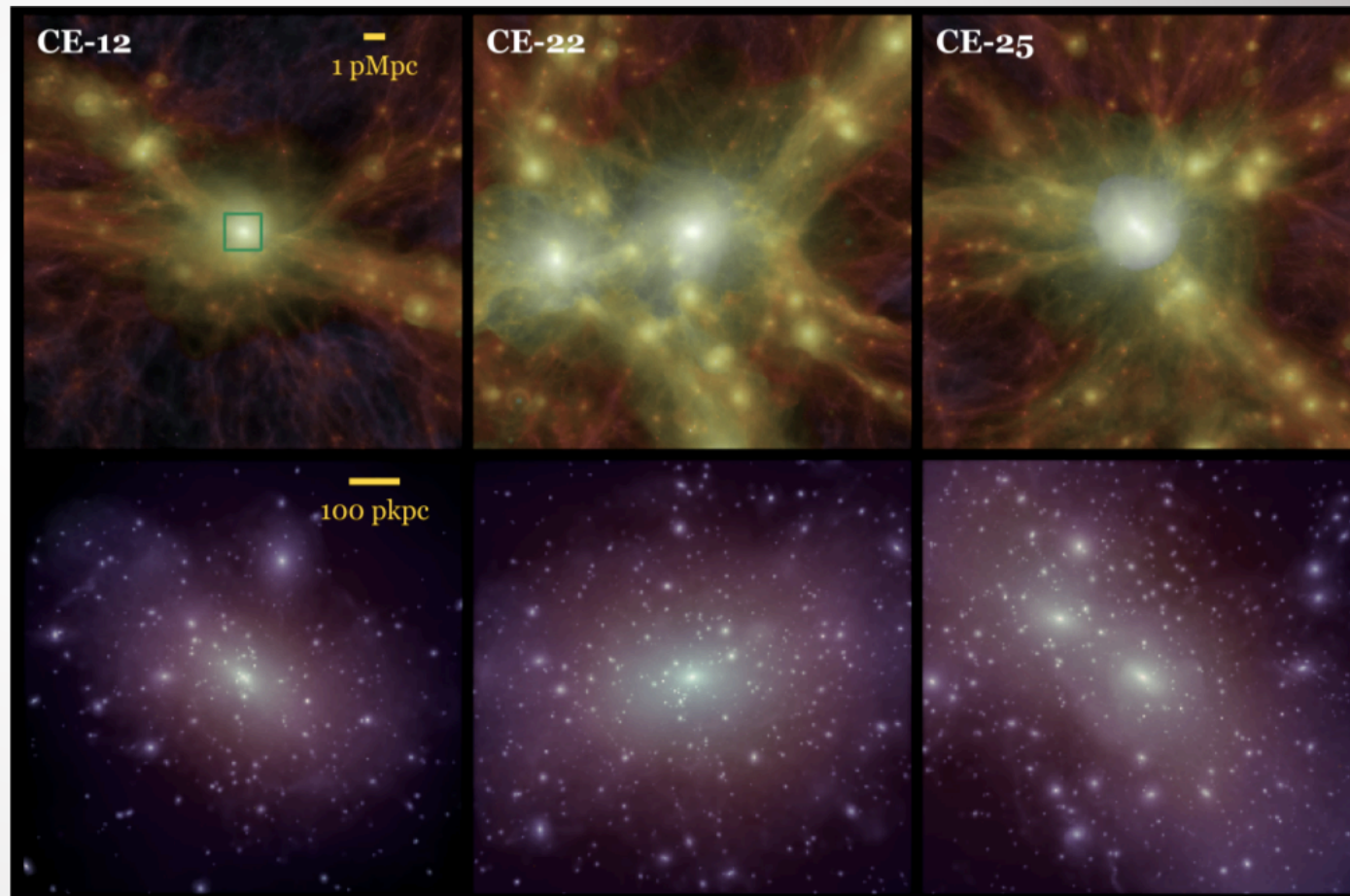
HYDRANGEA (Bahé et al. 2017) are high resolution hydrodynamical simulations of clusters with baryonic and dark matter

Checked mass estimation pipeline on HYDRANGEA cluster simulations

Quantitatively we find

$\sim 5 \pm 3\%$  bias for NFW masses

$\sim 3 \pm 2\%$  bias for aperture masses





# Cluster cosmology

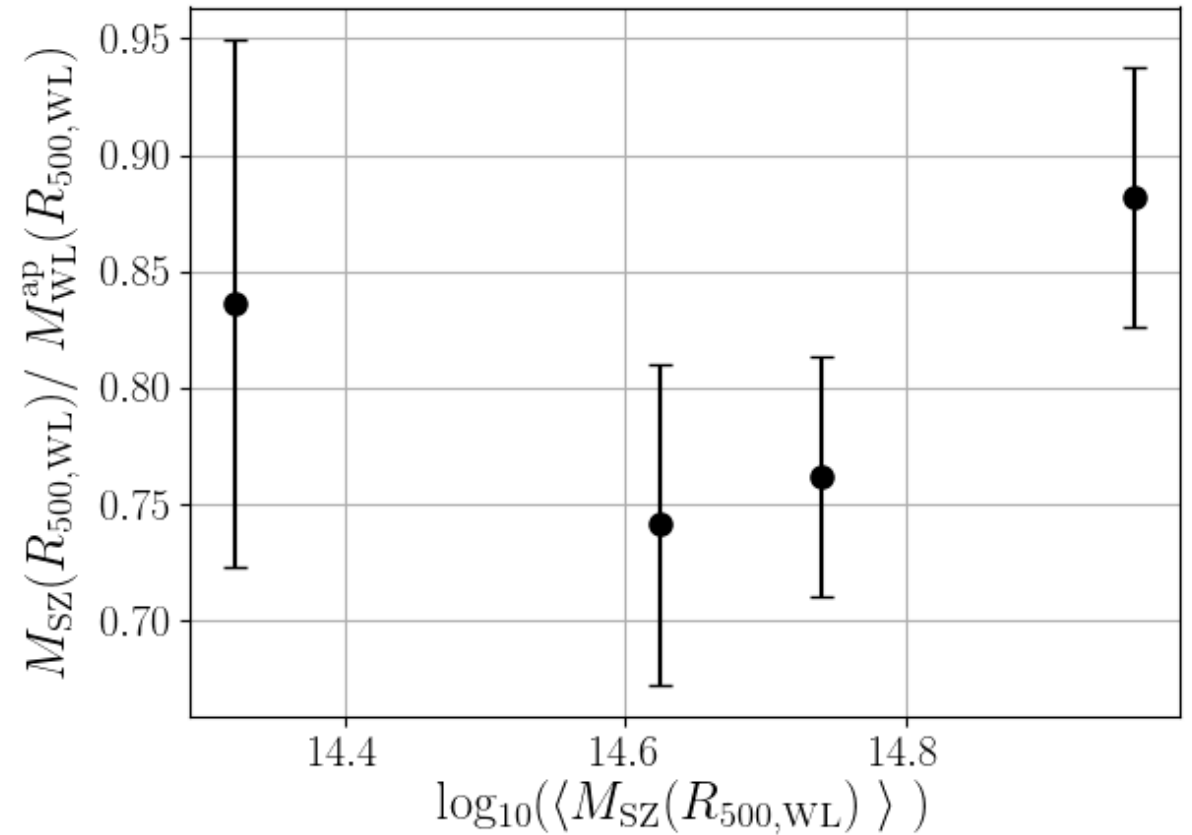
*Planck* has measured SZ masses for hundreds of clusters

- SZ masses are biased estimates of true cluster mass
- WL masses are imprecise estimates of true cluster mass
- Use WL to calibrate SZ masses

Consistent with 0.8, used for the 2015 *Planck* cosmological analysis

Higher than  $0.71 \pm 0.10$  of the reanalysis by Zubeldia & Challinor (2019)

No significant trend with mass



**Preliminary result**

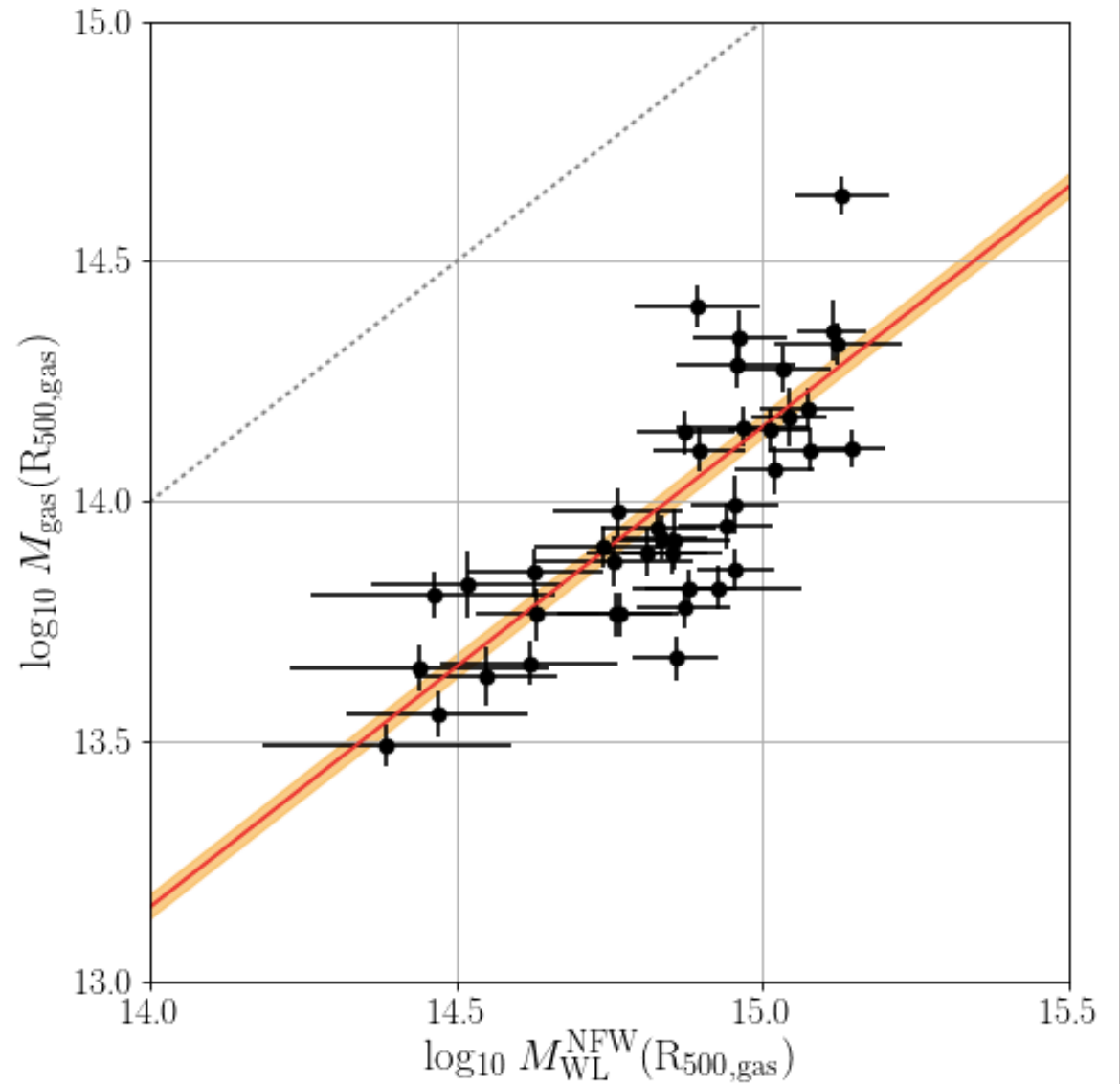
# Cluster cosmology

Mantz et al. have measured the mass of the gas content in clusters  
44 are in our weak lensing sample

Slope =  $0.143 \pm 0.008$

12 out of 44 are relaxed clusters

Gas fraction in relaxed clusters  
can be related to total amount  
of mass in the Universe  $\Omega_m$



Preliminary result



# Weak gravitational lensing of galaxy clusters

## Challenges

- Shear measurement  
~2% uncertainty
- Redshift distribution  
~4% uncertainty
- Contamination  
~2% uncertainty
- Mass determination  
~2% uncertainty

## MENeCS + CCCP

Great sample to constrain scaling relations with other mass proxies

- Range in masses and redshifts

Cluster lensing with single filter observations are possible

- Good news for Euclid

Look forward to cluster physics and cosmology