

# The Dark Energy Survey (DES): status, recent results, and mocks.

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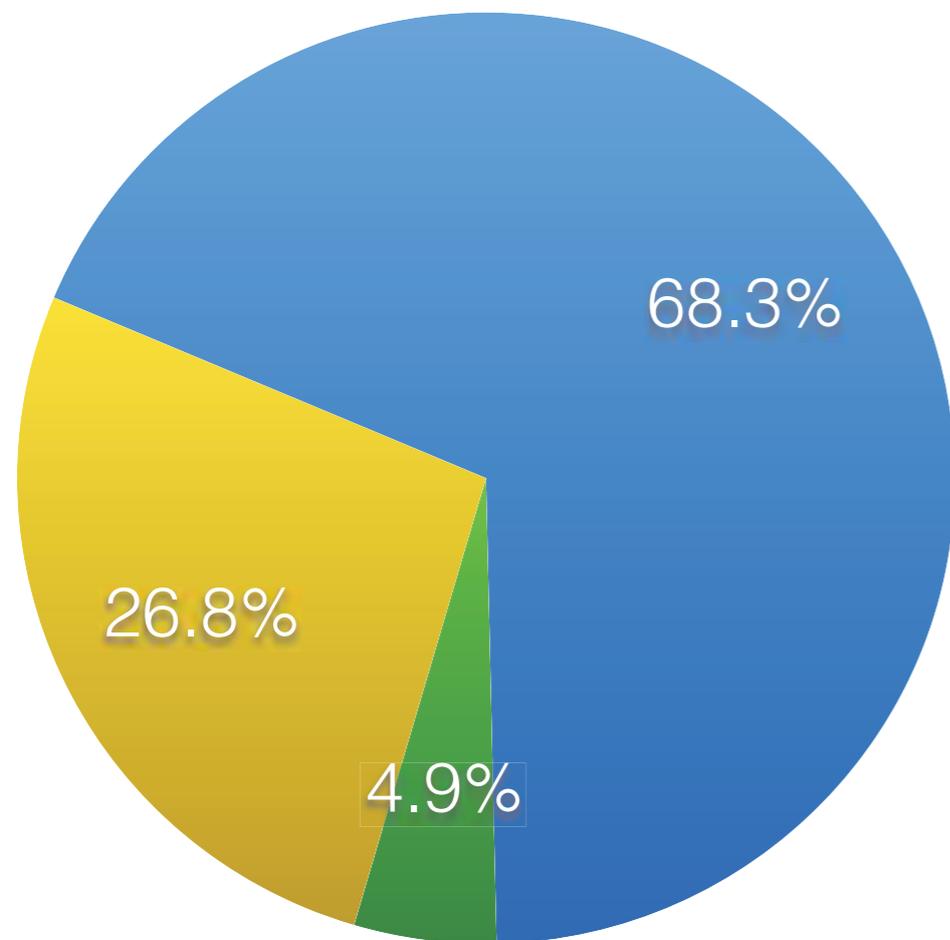
# OUTLINE

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- Motivation
- The Dark Energy Survey  
Recent Results
- Mock Galaxy Catalogues

# MOTIVATION: What is Dark Energy?

(maximally boring universe?)



Planck Results (2015)

- The expansion of the universe is accelerating.
- Dark Energy is about ~70% of the energy-density of the universe.
- What is it ?!

# MOTIVATION: What is Dark Energy?

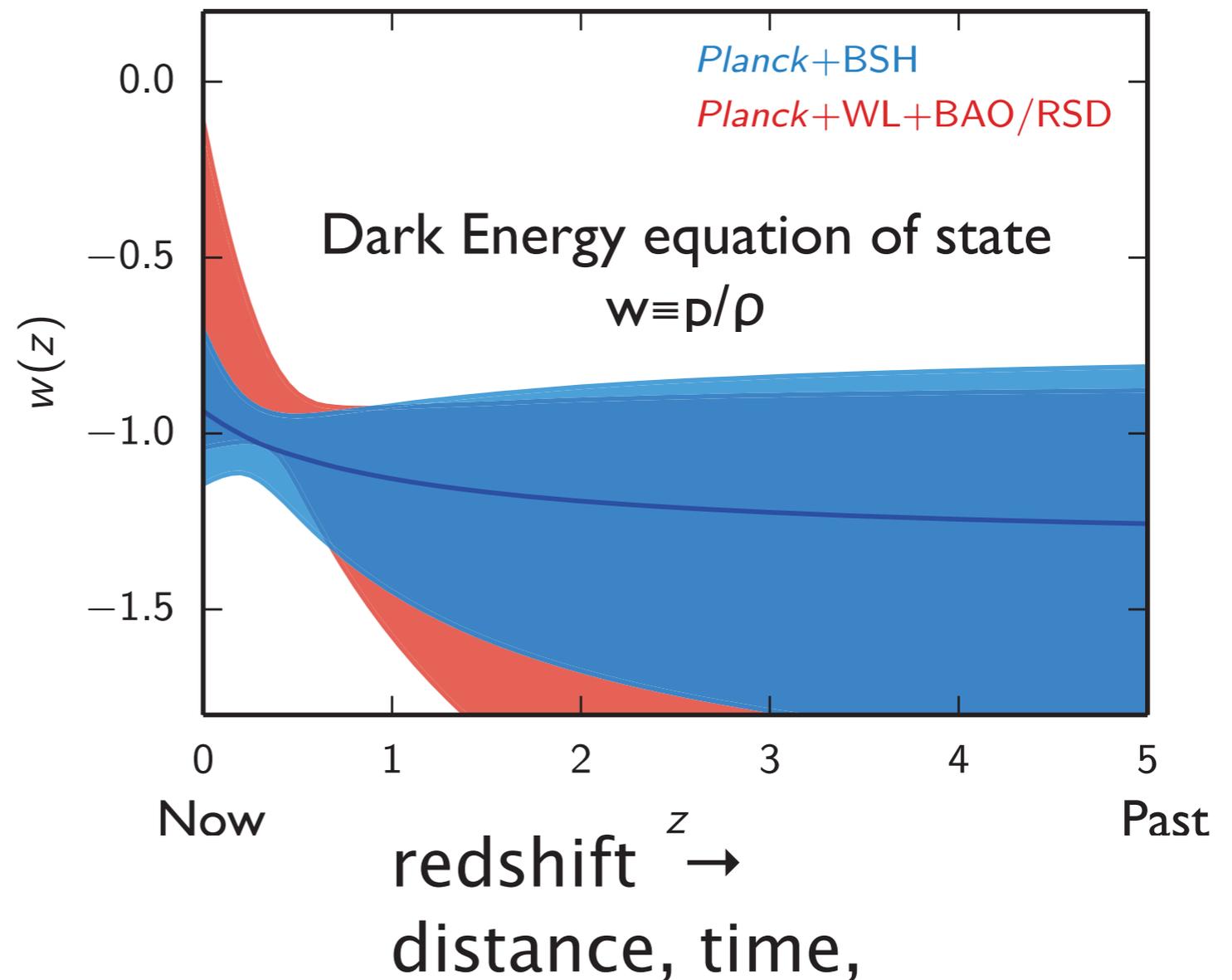
## (OBSERVATIONAL STATUS)

\* DE is consistent with  
“cosmological constant”

but:

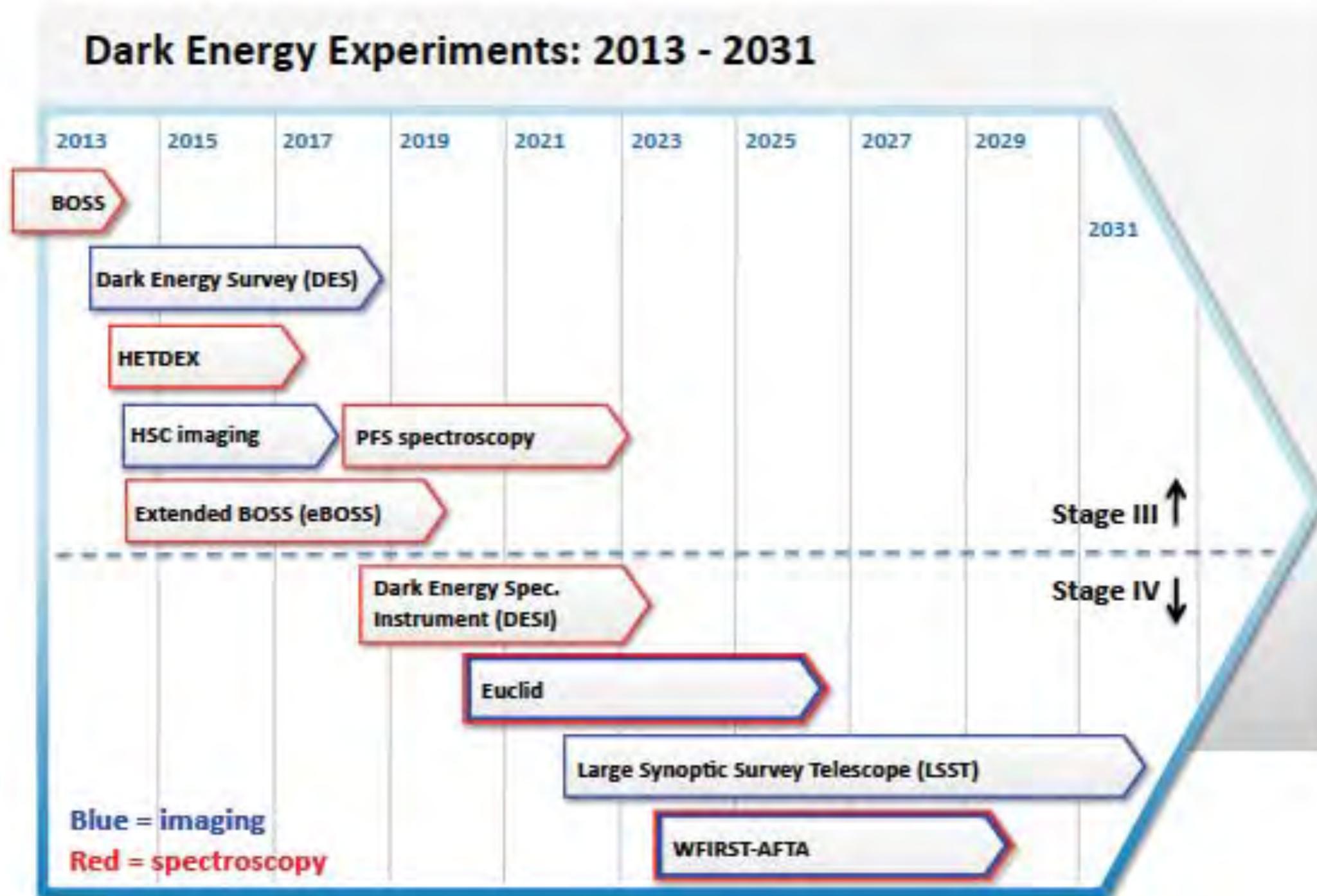
- ◆ value of  $\Lambda$  not natural
- ◆ Time evolution?
- ◆ Modified gravity?

$$R_{\mu\nu} - \frac{1}{2}Rg_{\mu\nu} + \Lambda g_{\mu\nu} = \frac{8\pi G}{c^4}T_{\mu\nu}$$



Planck Collaboration paper XIV

# MOTIVATION: What is Dark Energy?



# Measuring Dark Energy

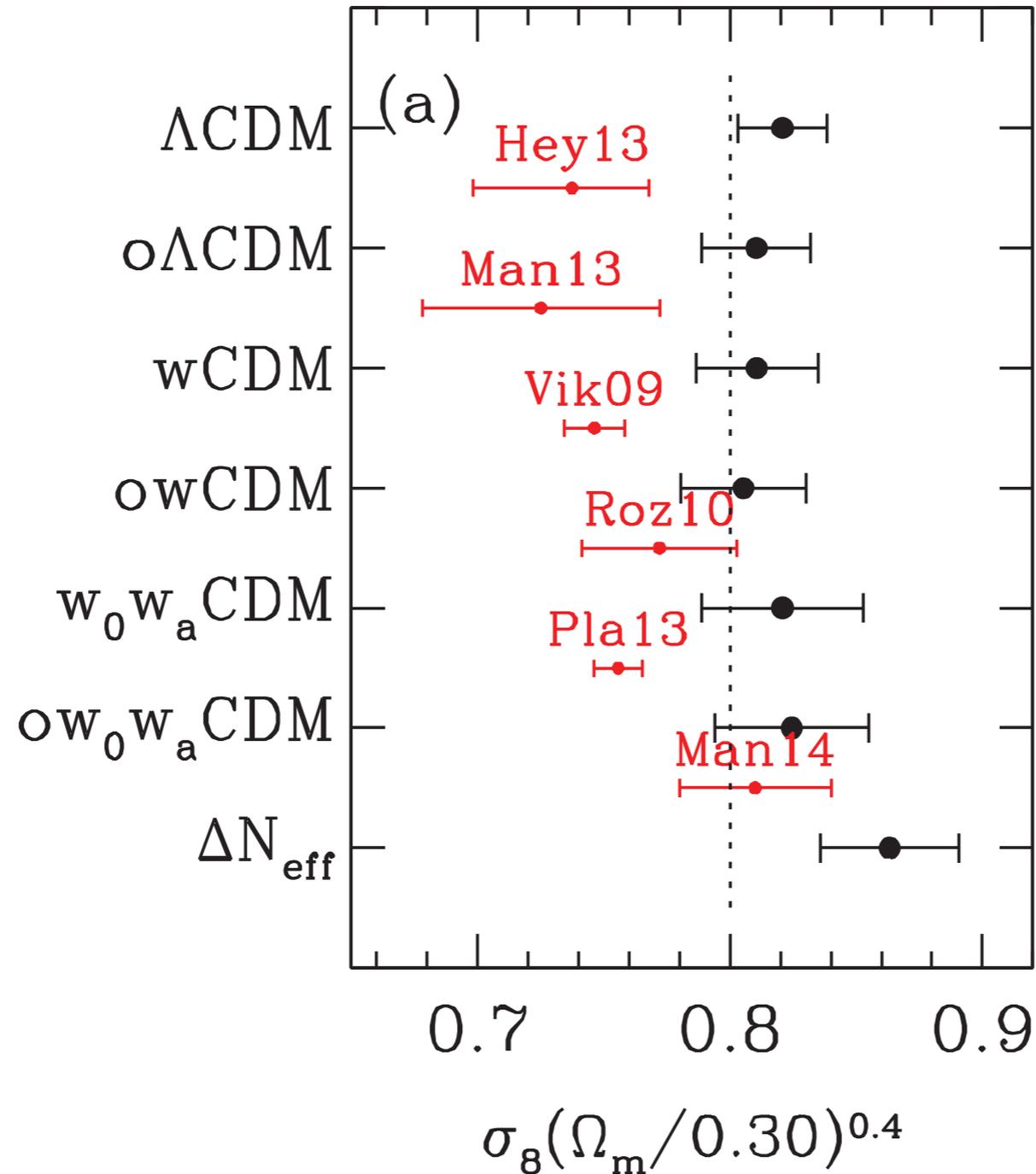
(STRATEGY: LOOK AT ITS EFFECTS)

- ◆ Geometry: distance vs. redshift
  - ◆ redshift tells degree of expansion
  - ◆ light-travel distance = time
- ◆ Dynamics: structure growth
  - ◆ growth rate depends on matter density
  - ◆ evolution in matter density  $\leftrightarrow$  evolution in dark energy density

# Measuring Dark Energy

(Tension btw geometrical and structure growth measurements)

Red points:  
Structure growth measurements

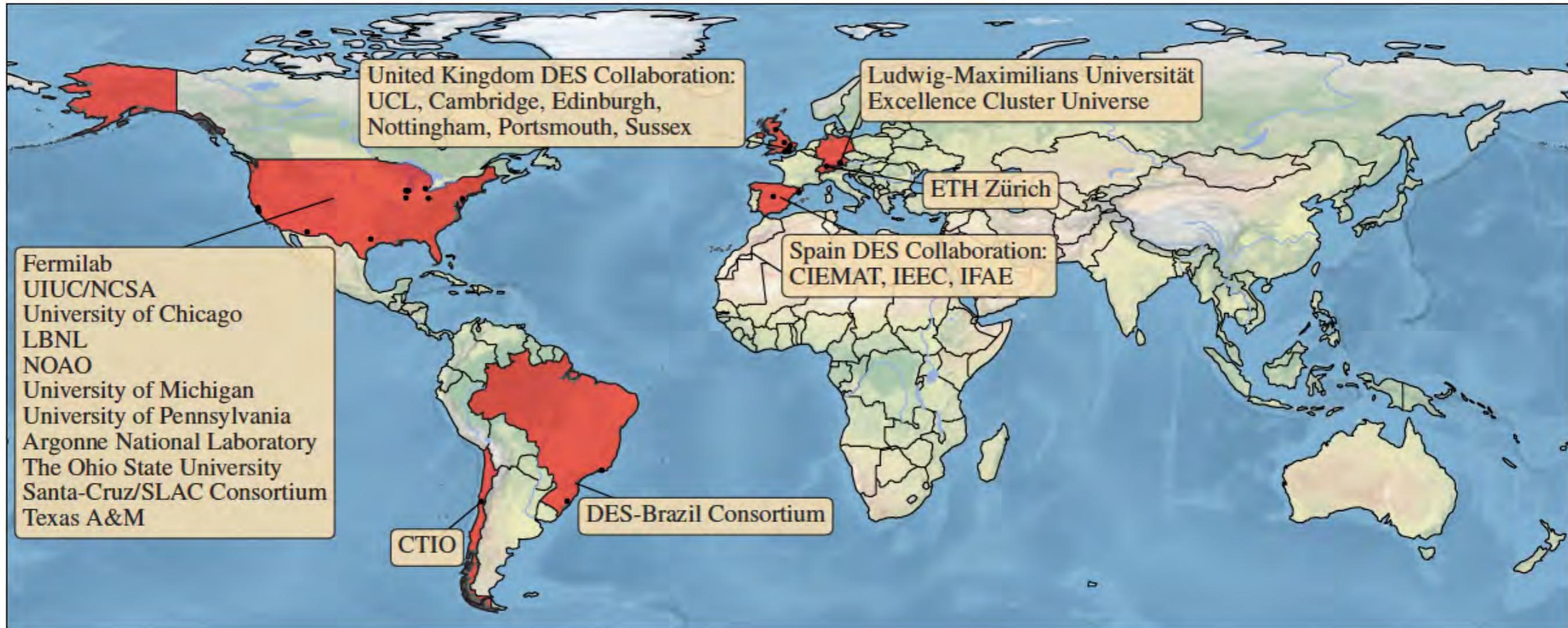


Black points:  
Derived from geometrical measurements for DE model

Aubourg et al. (2014)

# THE DARK ENERGY SURVEY

## Collaboration



~450 scientists

28 institutions

Director: Josh Frieman

Instrumentation lead: Brenna Flaugher

# THE DARK ENERGY SURVEY

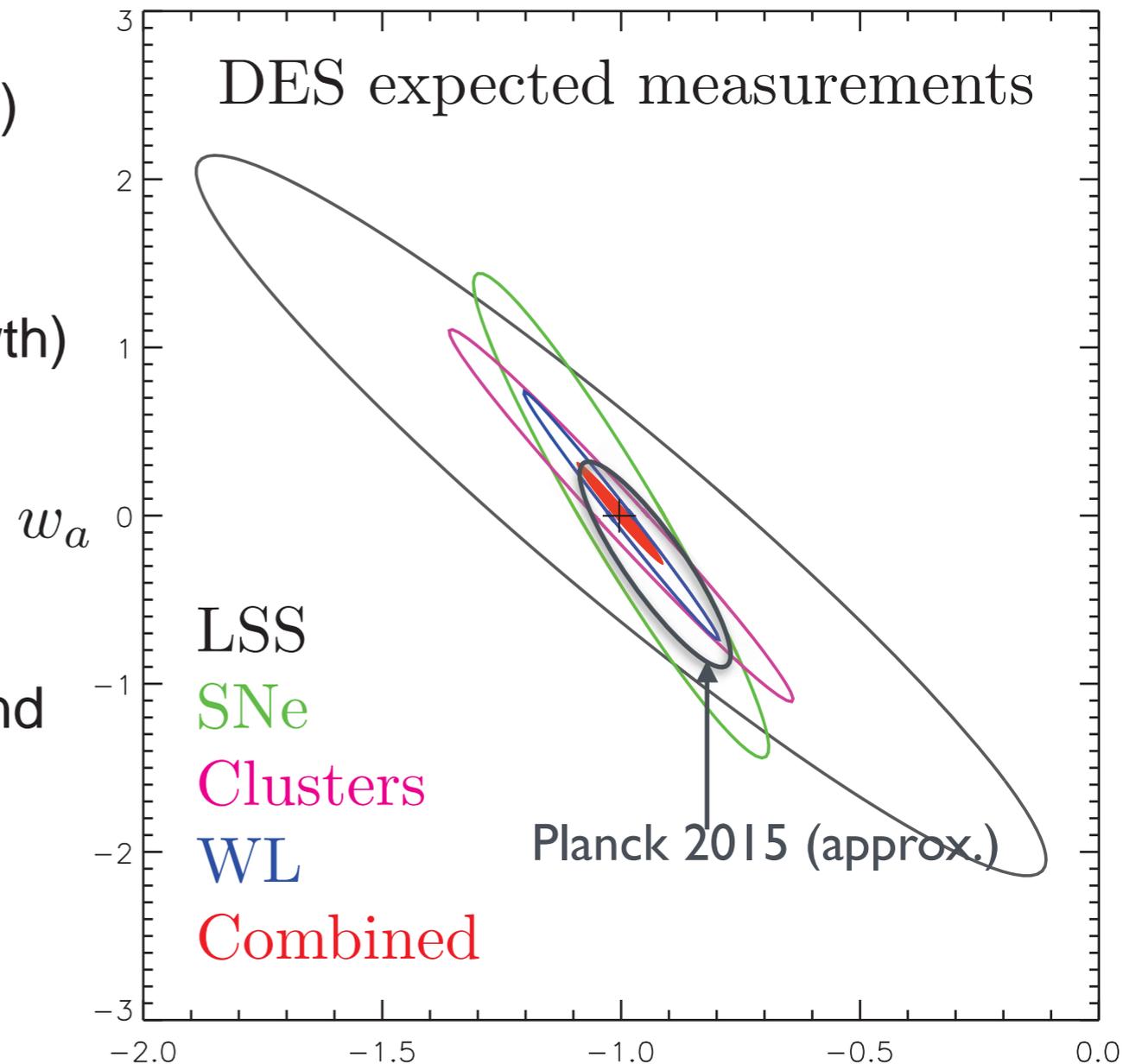
## 4-ways to constrain dark energy

**Weak lensing** (distance, structure growth)  
 shape and measurements of 200 millions galaxies

**Galaxy clusters** (distance, structure growth)  
 ten of thousands of clusters up to  $z \sim 1$   
 synergies with SPT, VHS

**Large Scale Structure** (distance)  
 standard ruler  
 300 millions galaxies to  $z=1$  and beyond

**Type Ia supernovae** (distance)  
 standard candles  
 3500 SNIa to  $z \sim 1$



Dark Energy equation of state  $w \equiv p/\rho$   
 $w(a) = w_0 + (1-a)w_a$

# OUTLINE: DES & First Results

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- ◆ The Dark Energy Survey

  - Telescope

  - Camera

  - Observing status

- ◆ Dark Energy Science

  - Weak lensing

  - Galaxy clusters

  - Large-Scale Structure

  - Supernovae

- ◆ non Dark Energy Science

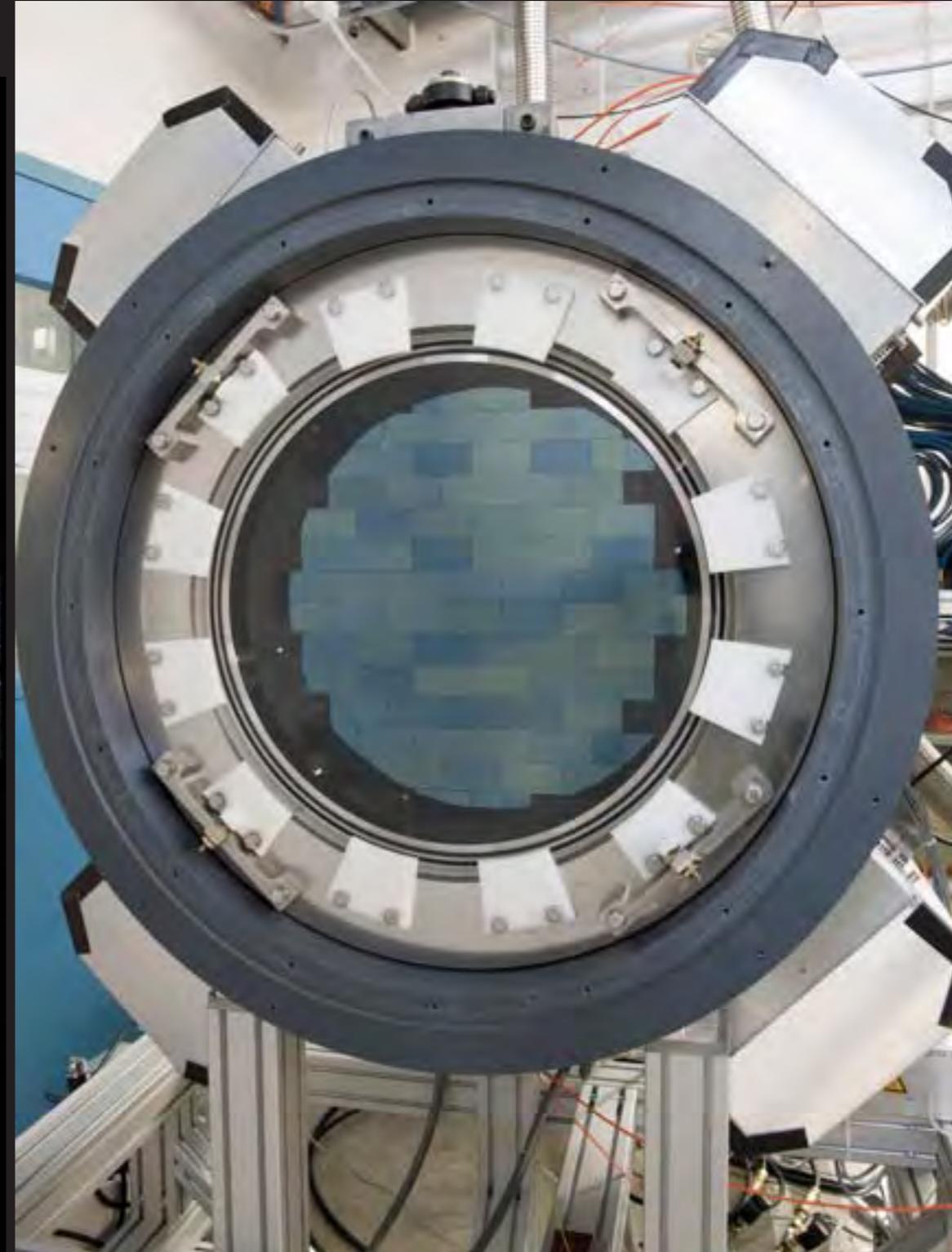
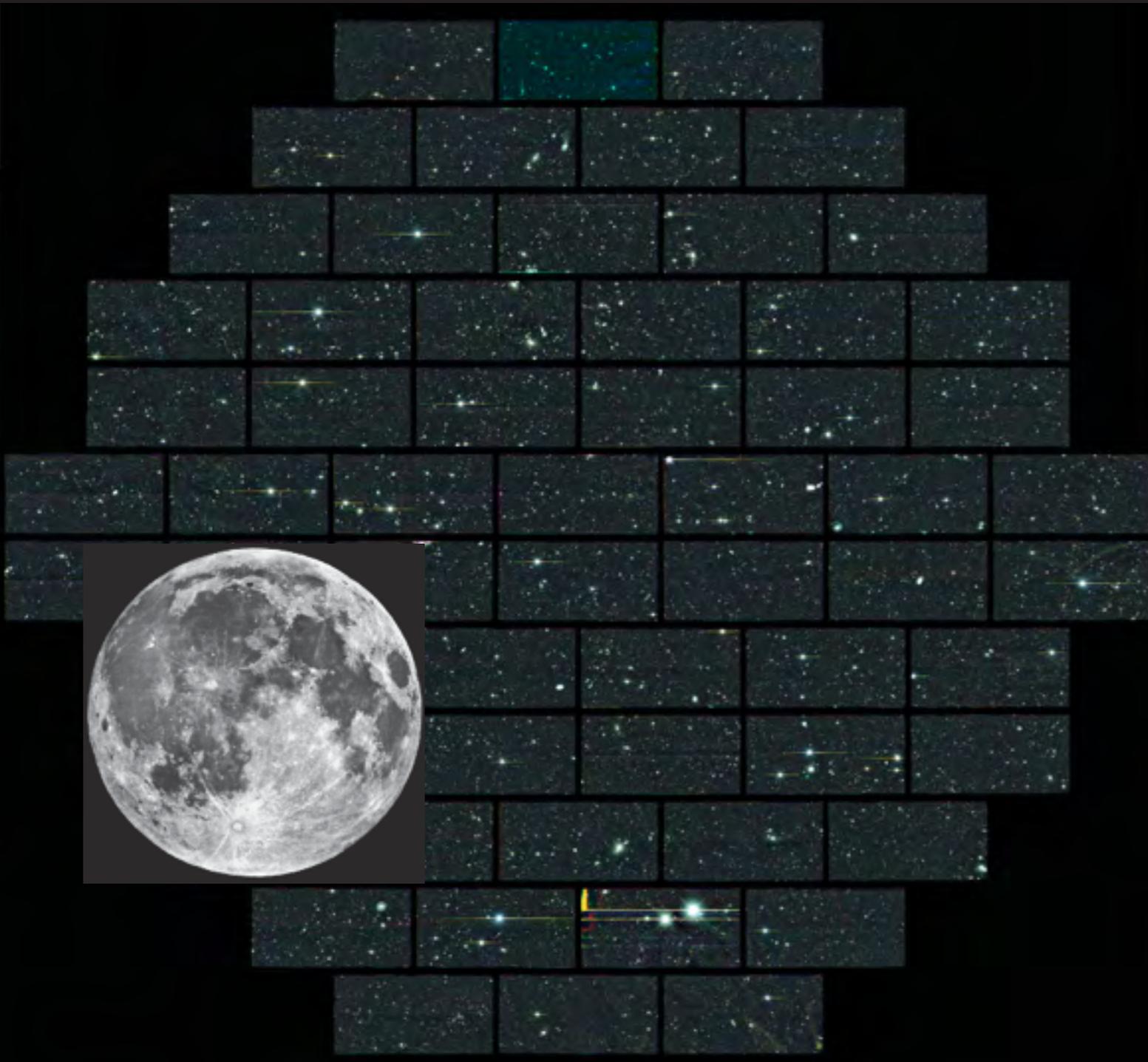
  - Discoveries!

# The Dark Energy Survey: telescope

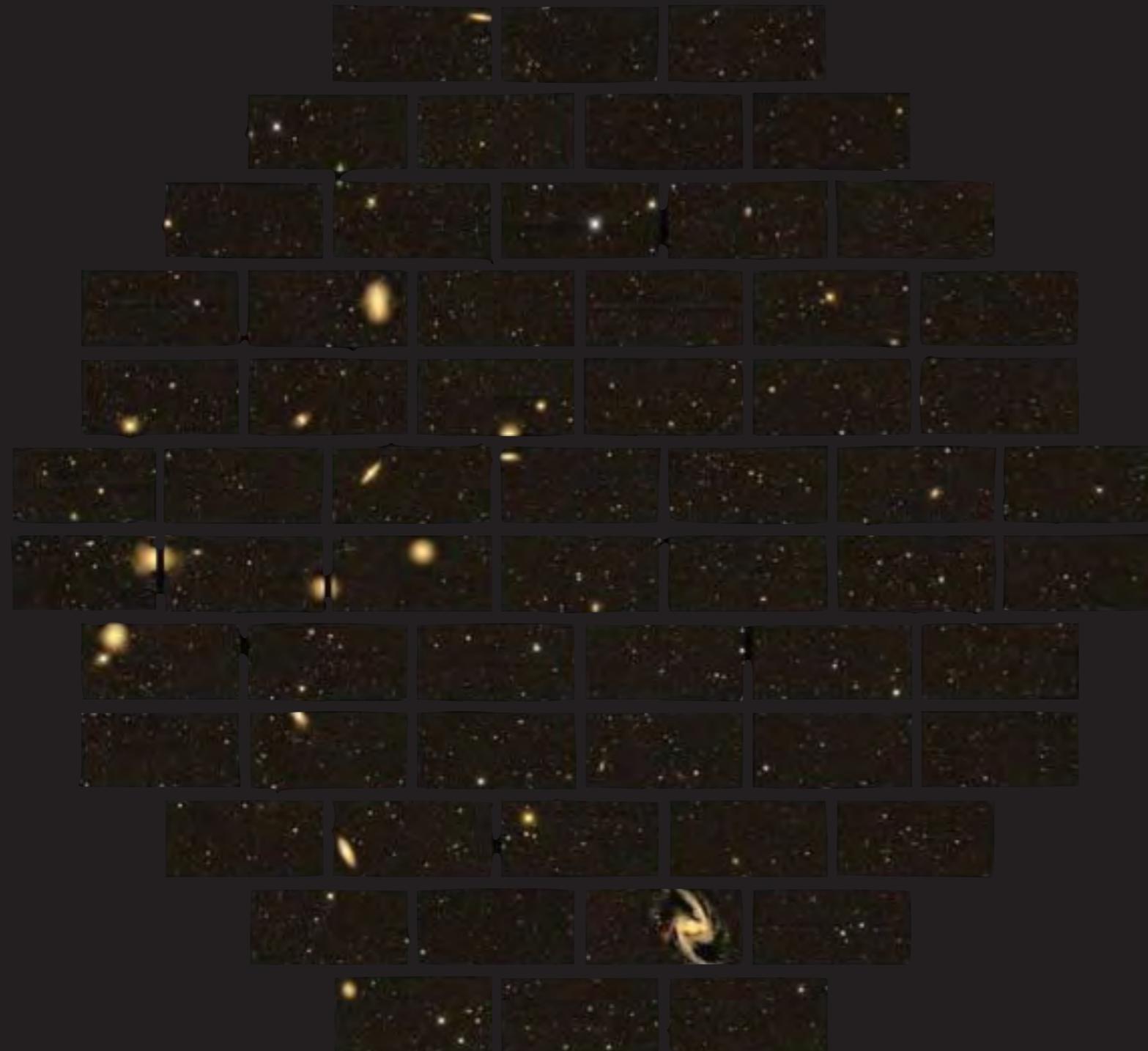
The Blanco 4-meter at CTIO Chile



# DES Field of View & Focal Plane



# 1st light: 12 Sept. 2012



Fornax cluster

# DES Early Data



...moment of zen...

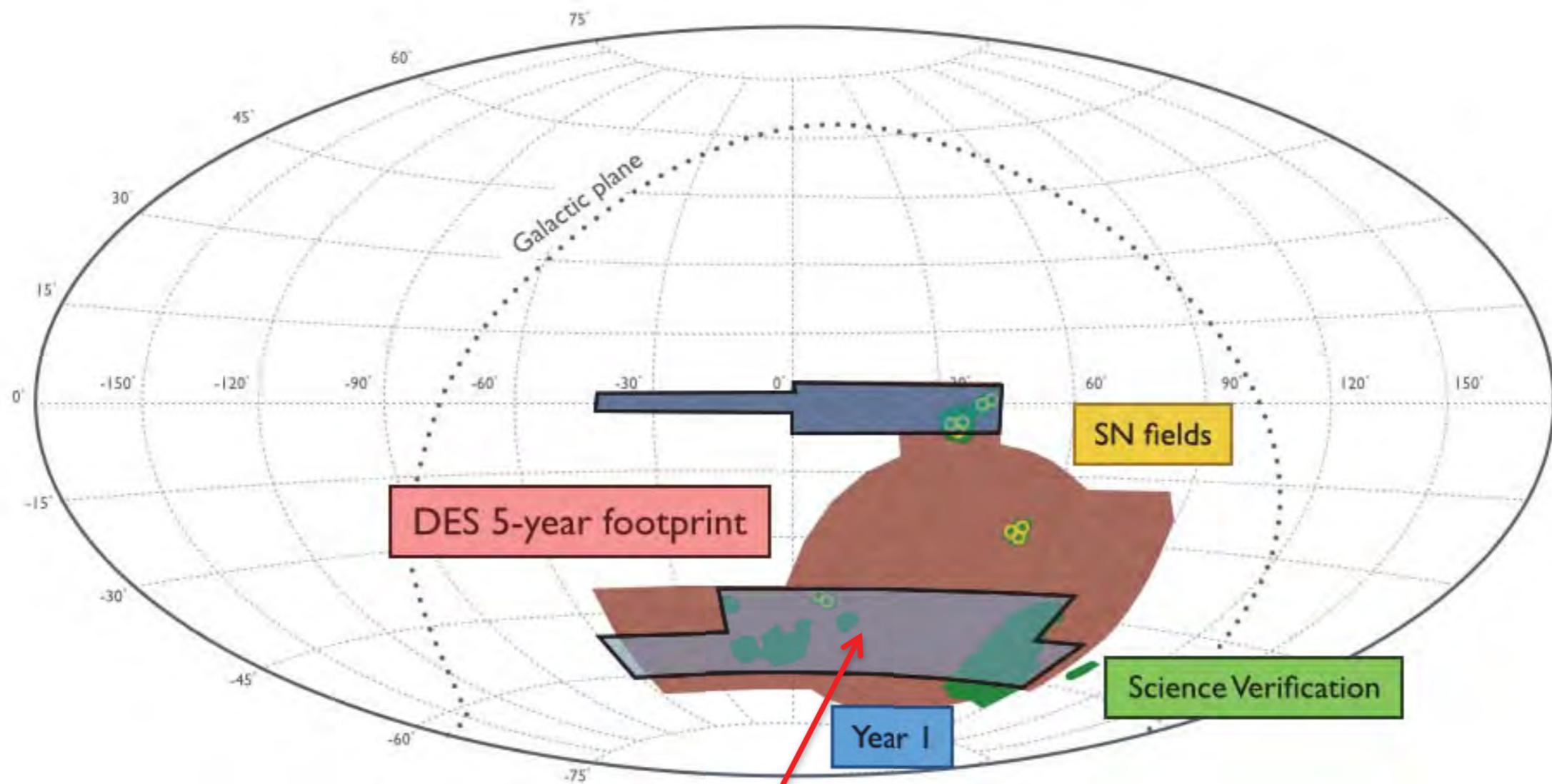
# The Dark Energy Survey

- Cerro Tololo Inter-American Observatory  
Blanco 4-meter telescope
- First light Sept. 12, 2012
- Survey 2013-2018, 525 nights
- DECam: 570 Mpix, 3 deg<sup>2</sup> FOV, griZY filters
- 5000 deg<sup>2</sup> survey footprint, to mag 24  
(redshift  $\sim 1.5$ ) + 30 deg<sup>2</sup> deep SN fields

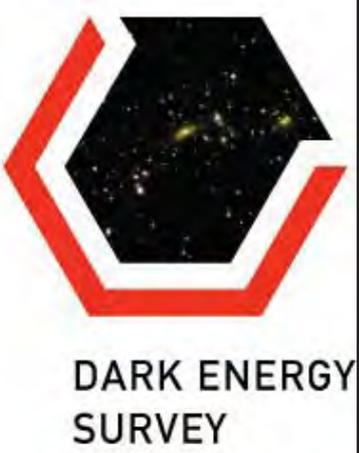




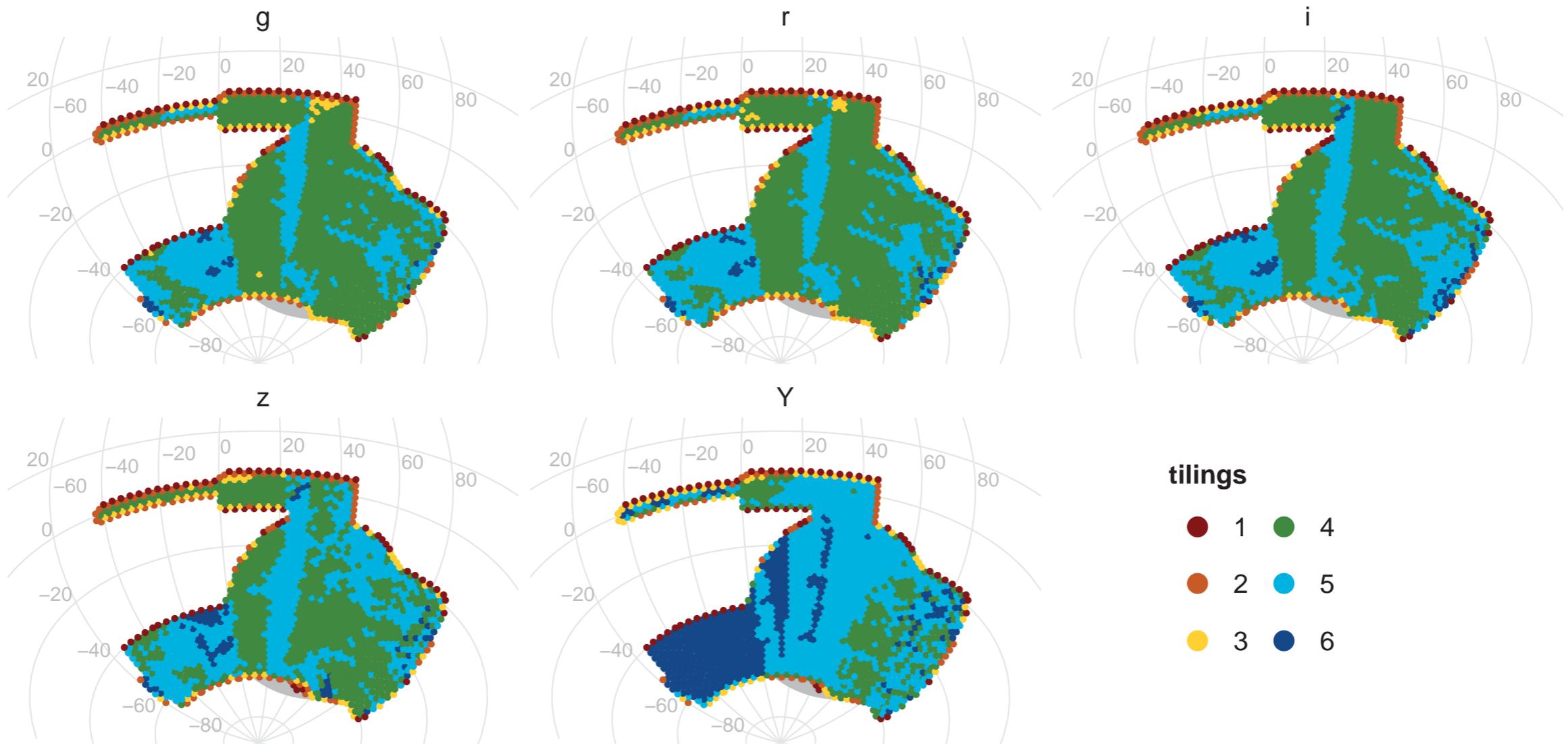
# Survey Footprint



Overlap with the South Pole Telescope Survey (SPT)

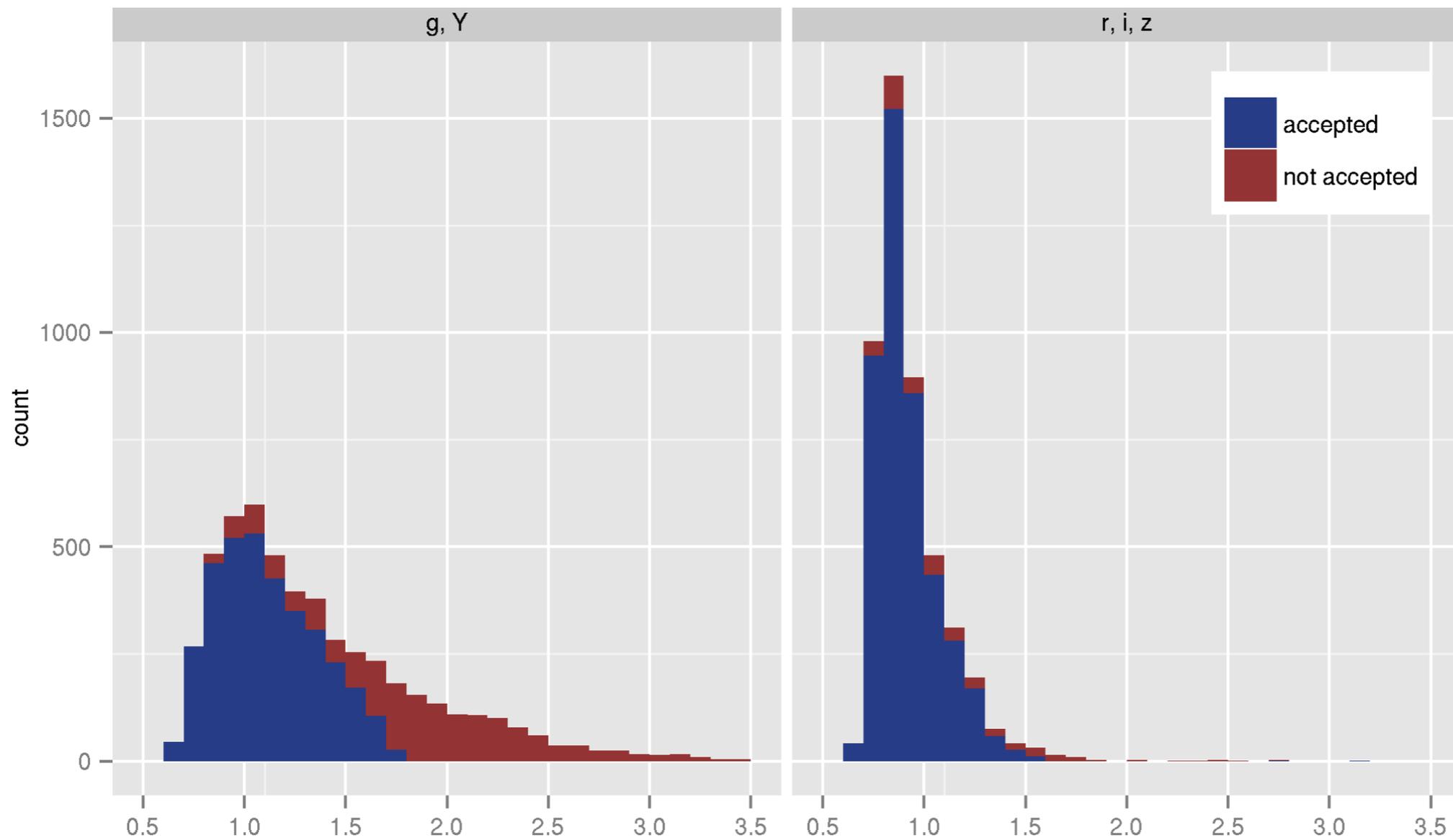


# Survey Progress (Y1+Y2+Y3 as of 01/05/2016)



# DES SEEING

The median delivered image quality in Y1 is approx FWHM 0.94 arcsec in filters riz (cf. 0.90 arcsec in WL science requirement) Improvements at telescope are underway (Y3 gives 0.89'' in z\_band).



# Dark Energy Survey



**Weak lensing** (distance, structure growth)  
shape and measurements of 200  
millions galaxies

**Galaxy clusters** (distance, structure growth)  
ten of thousands of clusters up to  $z \sim 1$   
synergies with SPT, VHS

**Large Scale Structure** (distance)  
standard ruler  
300 millions galaxies to  $z=1$  and beyond

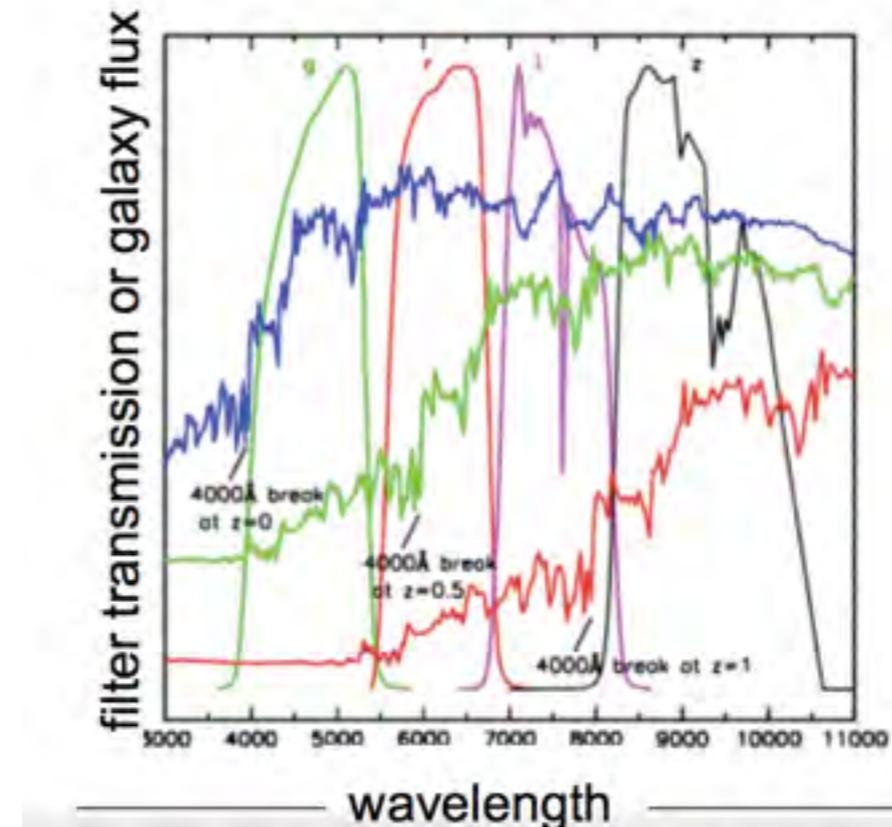
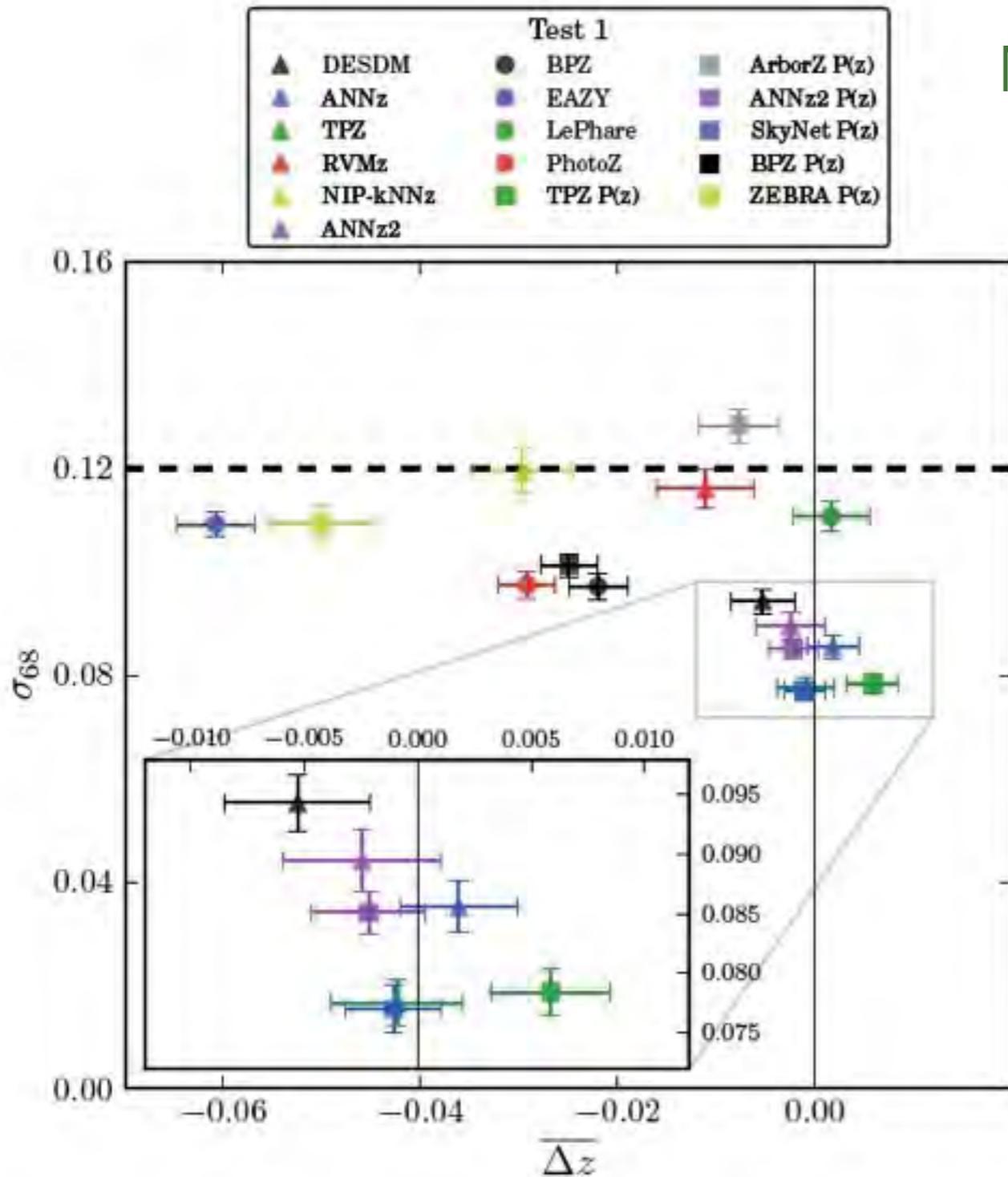
**Type Ia supernovae** (distance)  
standard candles  
3500 SNIa to  $z \sim 1$

shared photometry/footprint

# Results from Science Verification Data: Photometric Redshifts



Many codes already meet requirements



# OUTLINE: DES & First Results

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  - Observing status

- ◆ Dark Energy Science

  - Weak lensing

  - Galaxy clusters

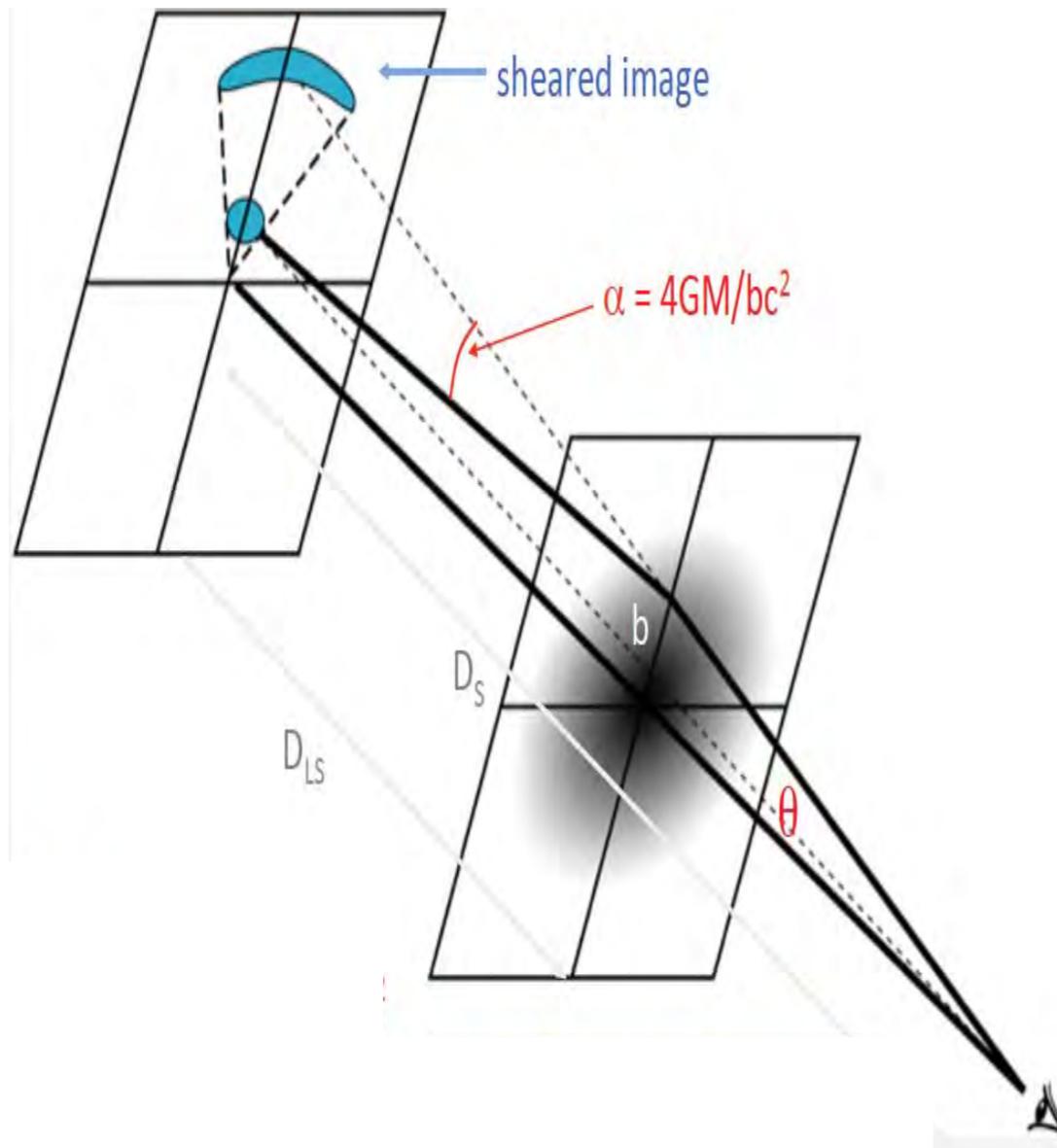
  - Large-Scale Structure

  - Supernovae

- ◆ non Dark Energy Science

  - Discoveries!

# Gravitational Lensing



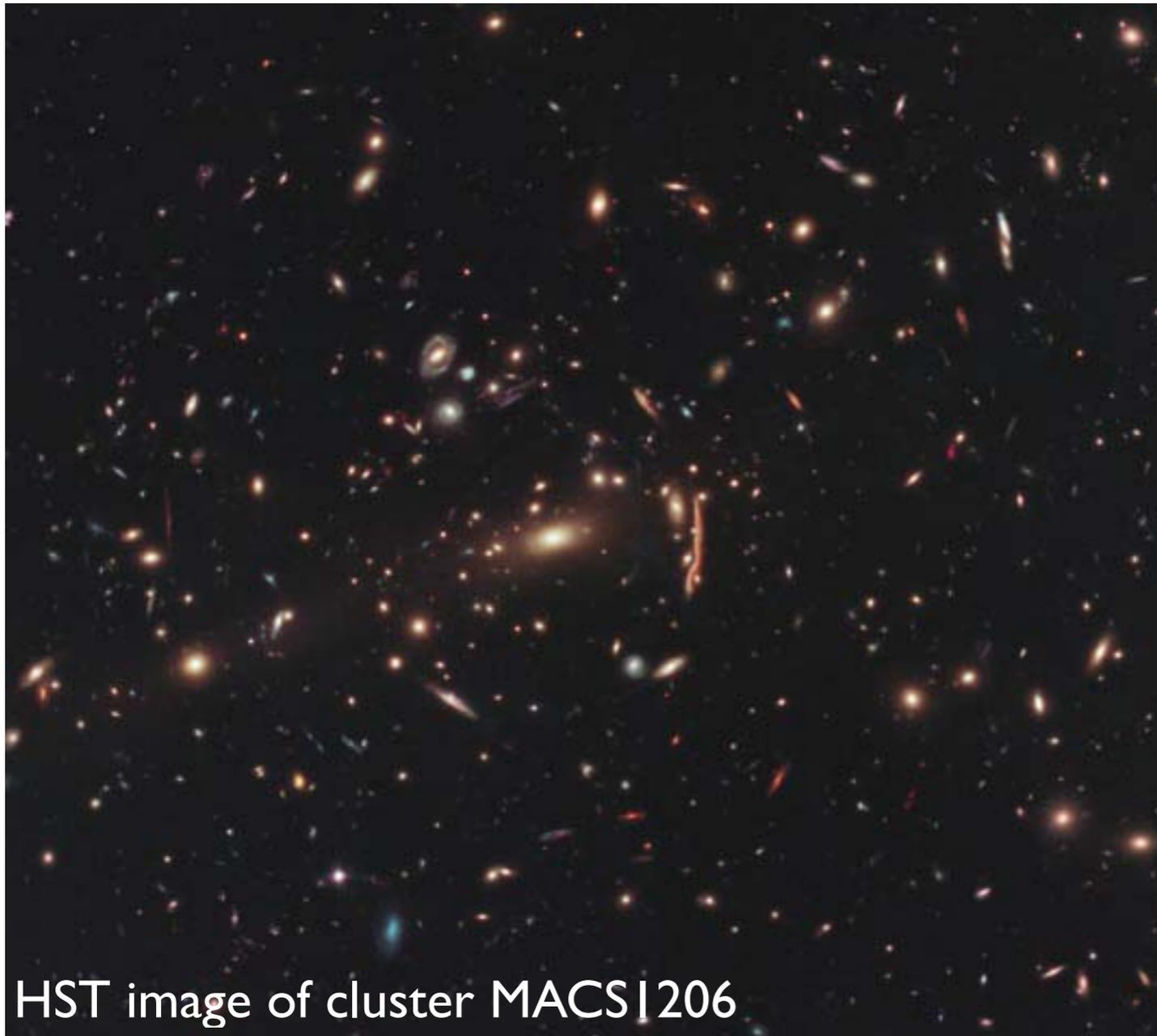
- ◆ Matter bends light and distorts galaxy shapes
- ◆ DES found 6 strong gravitational lensing systems (Three of which were unknown Nord et al. arXiv:1512.03062.)

$$A = (1 - \kappa) \begin{bmatrix} 1 & 0 \\ 0 & 1 \end{bmatrix} - \gamma \begin{bmatrix} \cos 2\phi & \sin 2\phi \\ \sin 2\phi & -\cos 2\phi \end{bmatrix}$$

$$\gamma = \gamma_1 + i\gamma_2 = \frac{1}{2} (\psi_{,11} - \psi_{,22}) + i\psi_{,12}.$$

$$\kappa = \frac{1}{2} \nabla^2 \psi;$$

# Gravitational Lensing



- ◆ Matter bends light and distorts galaxy shapes
- ◆ DES found 6 strong gravitational lensing systems (Three of which were unknown Nord et al. arXiv:1512.03062.)
- ◆ Unbiased tracer of matter distribution
- ◆ measure shapes to obtain “shear” catalog

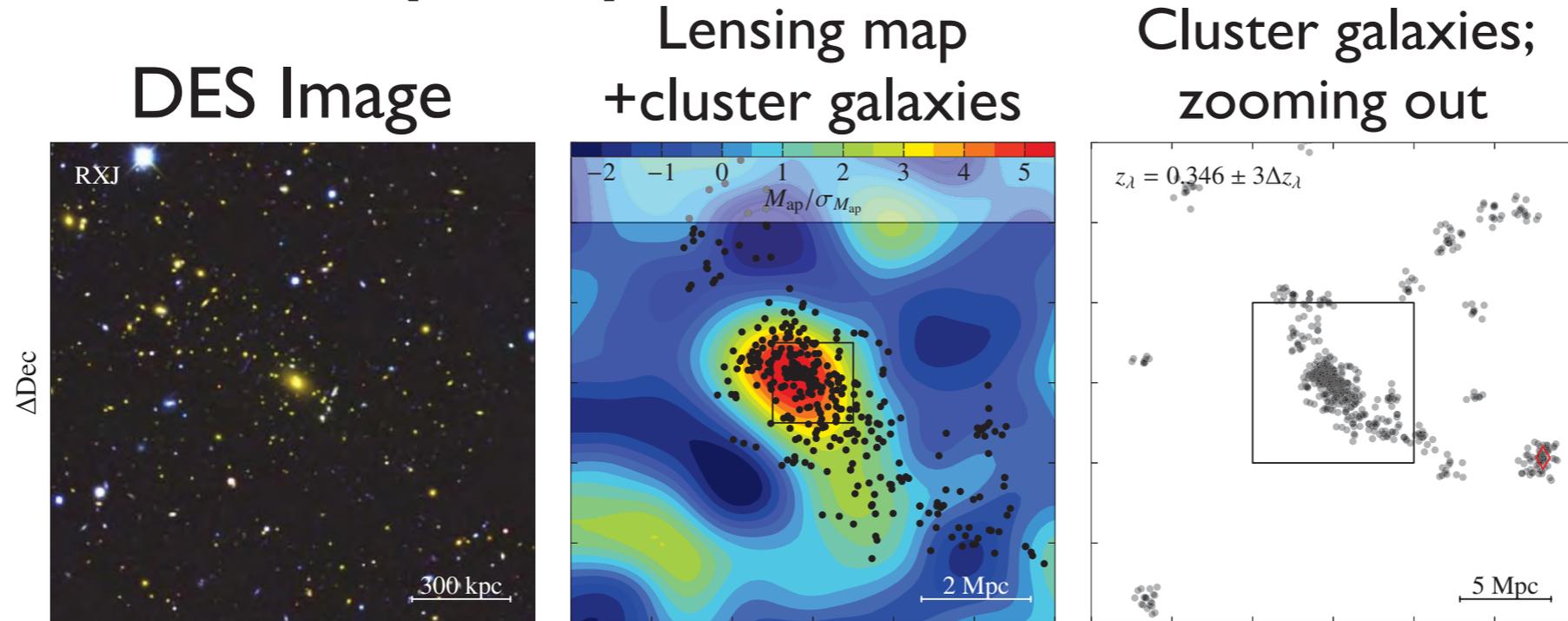
$$\kappa(\theta, r) = \frac{3H_0^2\Omega_m}{r} \int_0^r dr' \frac{r'(r-r')}{r} \frac{\delta(\theta, r')}{a(r')}$$

$$\gamma = \gamma_1 + i\gamma_2 = \frac{1}{2}(\psi_{,11} - \psi_{,22}) + i\psi_{,12}.$$
$$\kappa = \frac{1}{2}\nabla^2\psi;$$

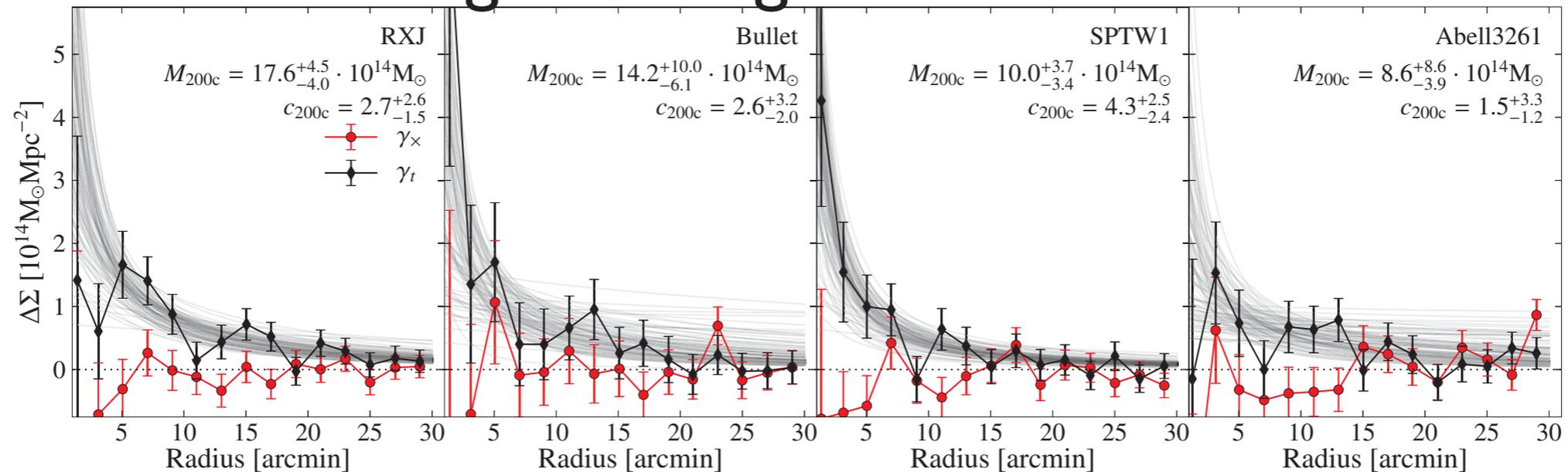
# DES Clusters: *Mass and galaxy distributions of four massive galaxy clusters*



Melchior et al. (2014)

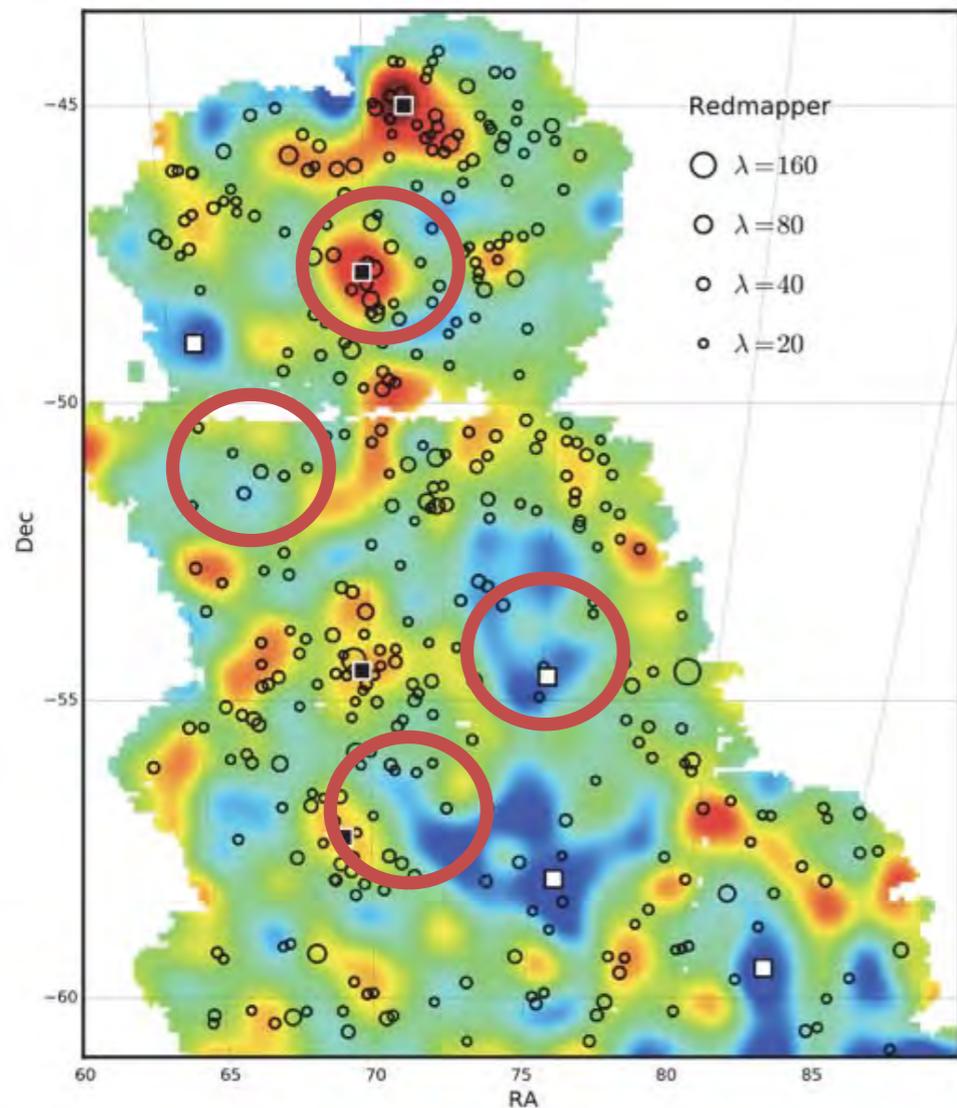


weak lensing shear signal around each cluster:





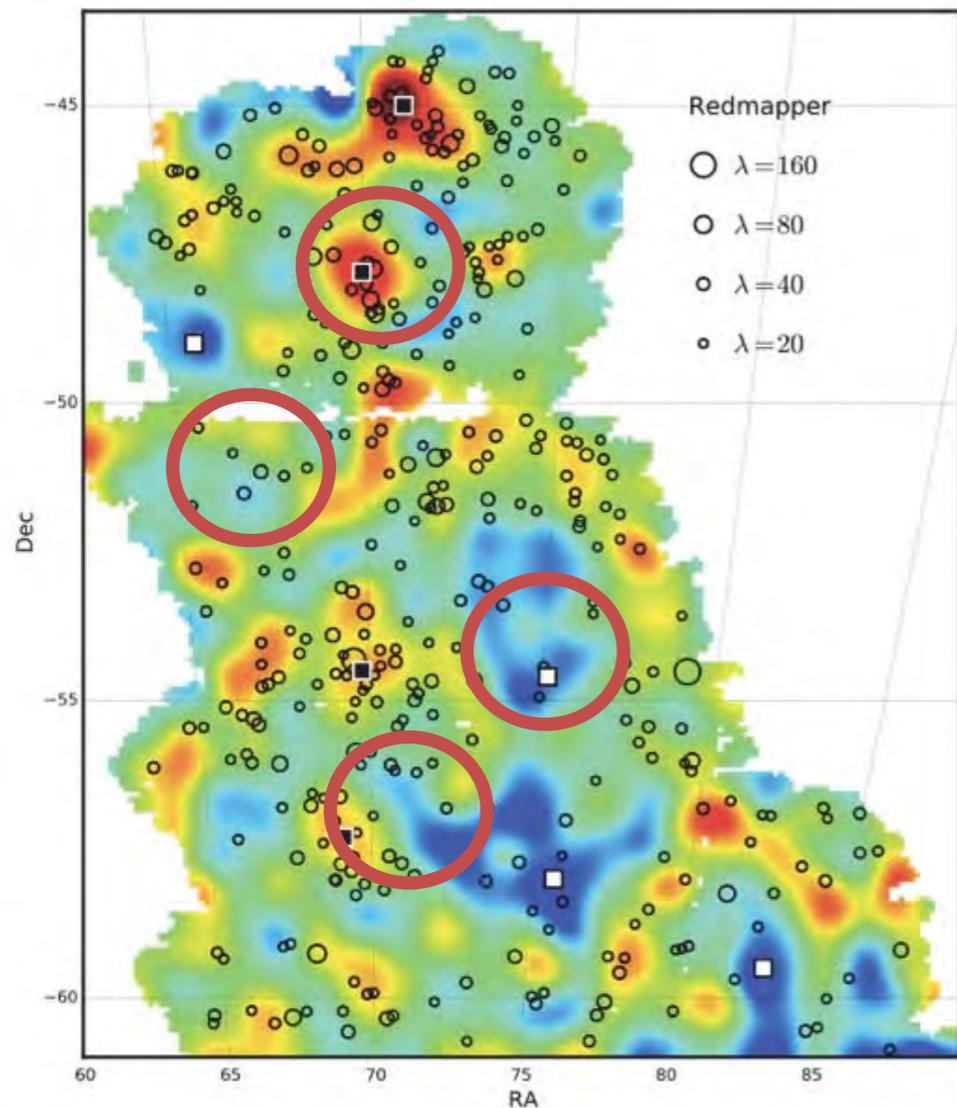
# Weak lensing and galaxy statistics



DES WL kappa and cluster map  
Chang, Vikram, Jain et al 2015.

- Investigate the correlation between galaxies and the weak lensing field.
- Count in cells: we throw circles randomly and obtain galaxy counts and average values of  $\kappa$ , and  $\kappa_{gal}$ .
- Test the log-normality of each field separately, as well as jointly (cf Wild et al.)
- Check the validity of the log-normal model: compare the results from those measured directly from data.
- Get estimation of galaxy bias and compare it with clustering results.

# Data



DES WL kappa and cluster map  
Chang, Vikram, Jain et al 2015.

- Galaxies: Benchmark
  - $18.0 < i < 22.5$
  - $0 < g-r < 3$  and  $0 < r-i < 2$  and  $0 < i-z < 3$ .
  - (not confused with stars) modest class = 1
  - $60 < ra < 95$  and  $-62 < dec < -40$  (SPT-E)
  - $0 < z < 0.5$ ; photoz from skynet
- Lensing:
  - s
  - kappa maps as in chang et al. using Kaiser-Squires

- 
- ✦ We use circles with radius from 10 to 40 arcminutes
  - ✦ We test our methodology with MICE simulations

# Why log-normal

## Right shape

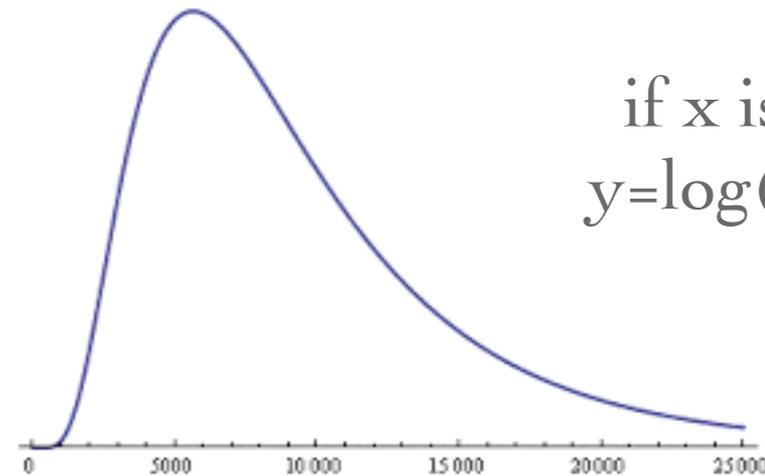
- Bounded at zero
- Skewed

## Galaxies

- Hubble 1934
- Coles & Jones 1991
- Kayo & Suto 2001
- Wild et al 2005 etc...

## Kappa

- Taruya et al. 2001
- Hilbert et al. 2011
- Joachimi et al. 2011



if  $x$  is lognormal  
 $y = \log(x)$  is normal

“The lognormal model applies to non-linear processes in the same way the normal distribution does to linear ones.

If you have a quantity  $Y$  which is the sum of  $n$  independent effects,  $Y = X_1 + X_2 + \dots + X_n$ , the distribution of  $Y$  tends to be normal by virtue of the Central Limit Theorem regardless of what the distribution of the  $X_i$  is

If the process is multiplicative so  $Y = X_1 \times X_2 \times \dots \times X_n$ , since  $\log Y = \log X_1 + \log X_2 + \dots + \log X_n$ , the Central Limit Theorem makes  $\log Y$  normal.

The lognormal is a good distribution for things produced by multiplicative processes, such as hierarchical fragmentation or coagulation processes: e.g distribution of sizes of the pebbles on a beach. “

# Basic Equations

The convergence is an integrated quantity of the matter density weighted by a geometrical lensing function.

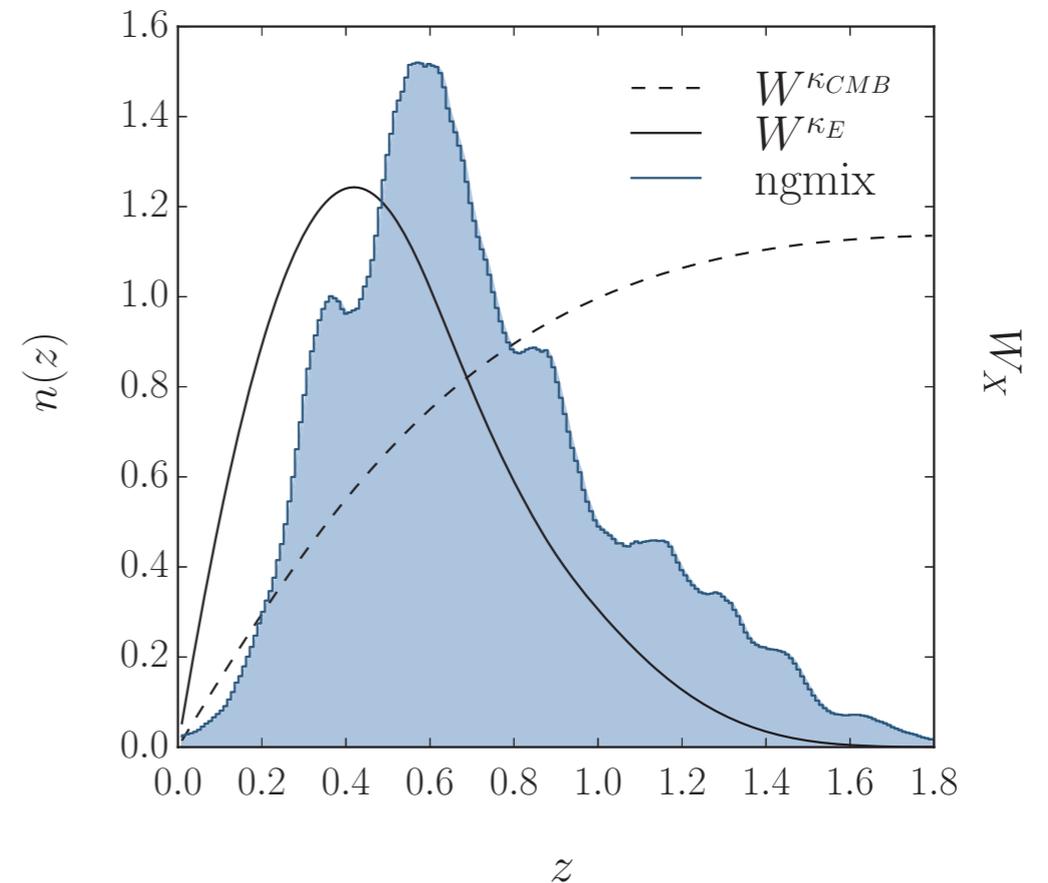
$$\kappa(\theta, r) = \frac{3H_0^2 \Omega_m}{2} \int_0^r dr' \frac{r'(r-r')}{r} \frac{\delta(\theta, r')}{a(r')}.$$

## Noise:

galaxy and kappa field have a contribution from noise, which is taken into account.

$$P(\kappa) = \frac{1}{\sqrt{2\pi}\sigma} \int_{-1}^{\infty} \exp\left[-\frac{(\kappa - \kappa')^2}{2\sigma^2}\right] f(\kappa) d\kappa'$$

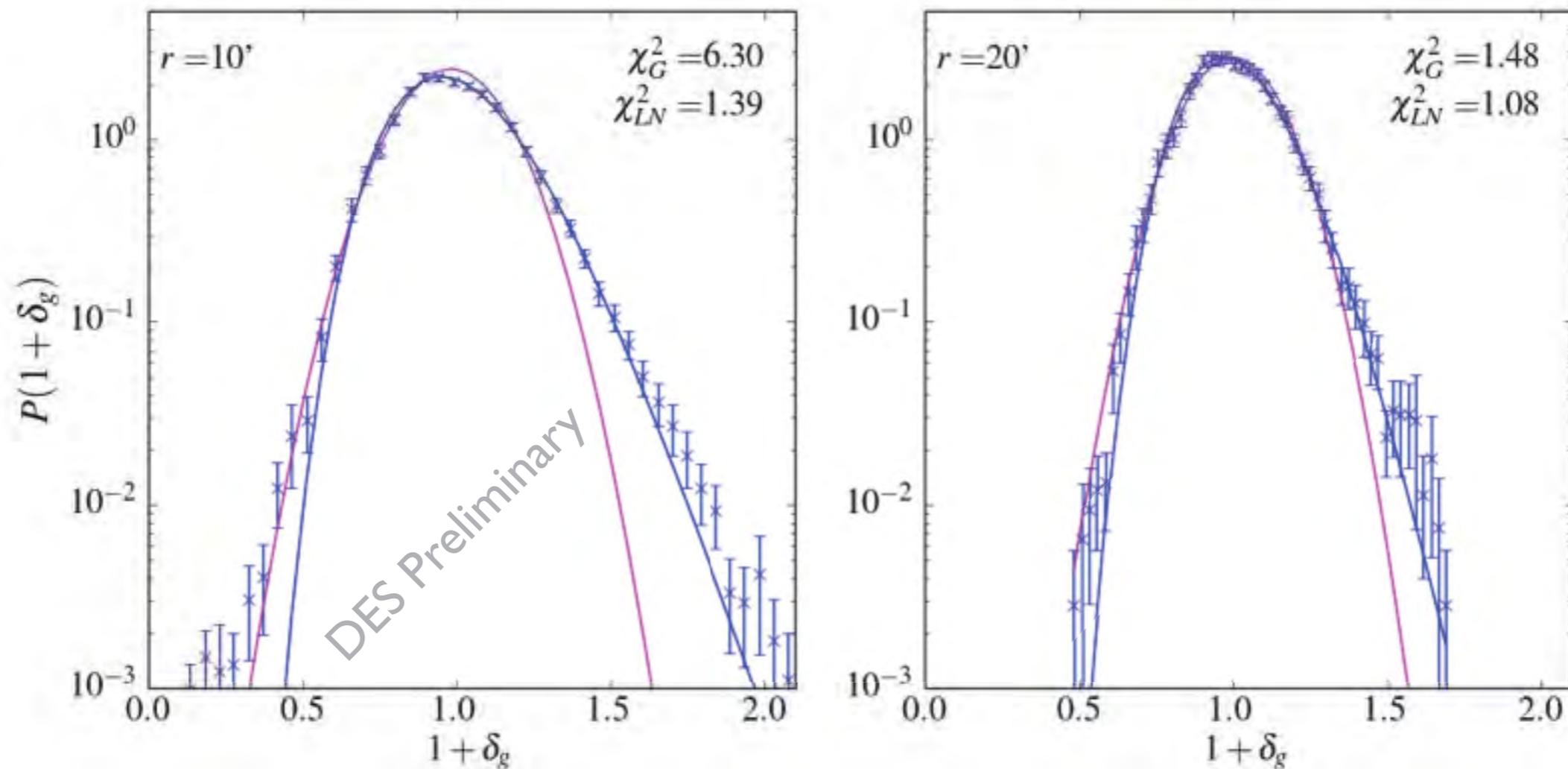
shape noise



$$P(N) = \int_{-1}^{\infty} \frac{\bar{N}^N (1 + \delta)^N}{N!} e^{-\bar{N}(1+\delta)} f(\delta) d\delta$$

shot-noise

# Log-normal galaxy fits as a function of scale

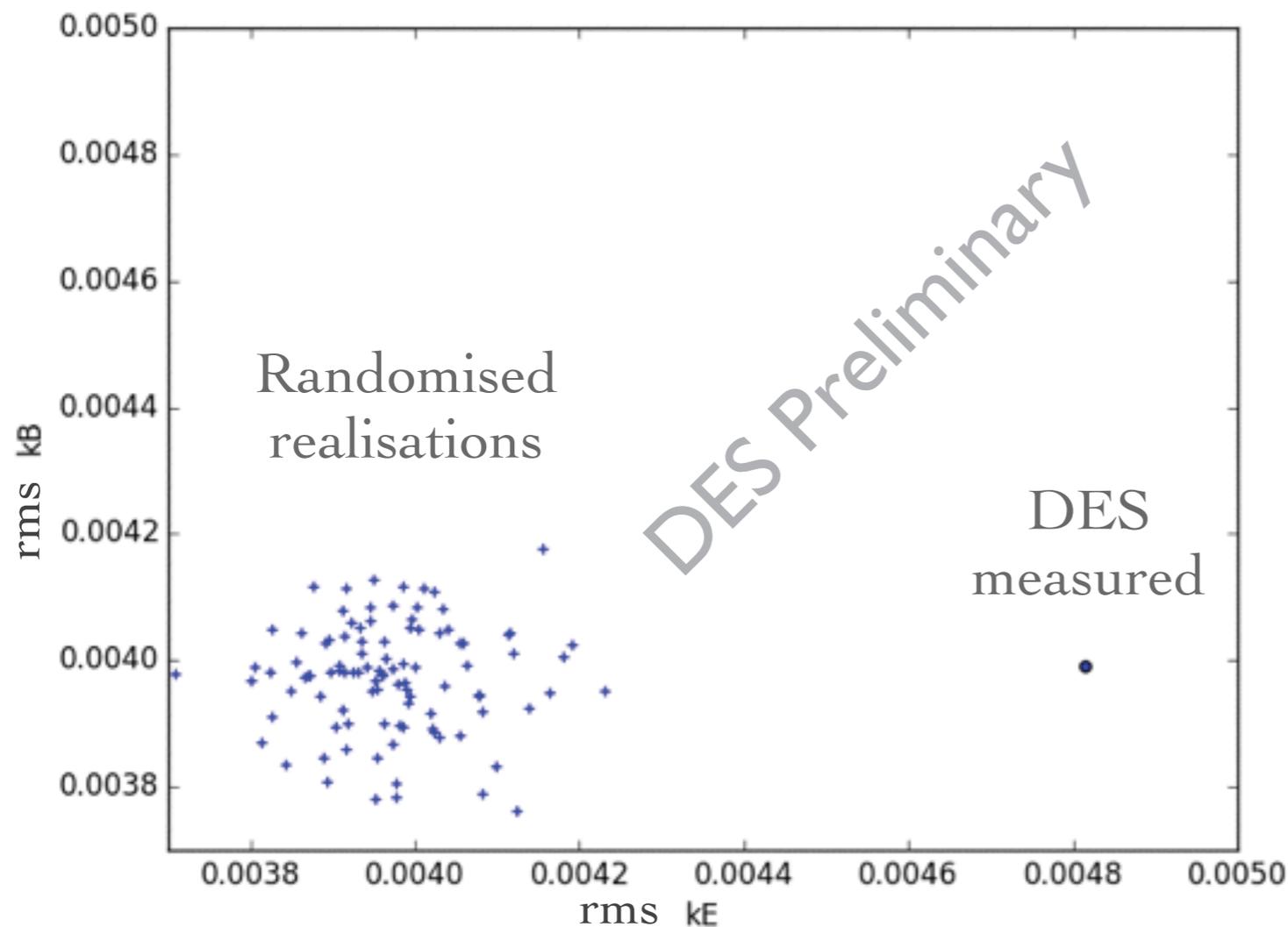


The distribution of galaxies becomes more gaussian as the counts in cells radius increases.

Clerkin, Kirk, MM, Lahav et al. (in prep)

$10' \rightarrow 4.6 \text{ Mpc @ } z=0.8$

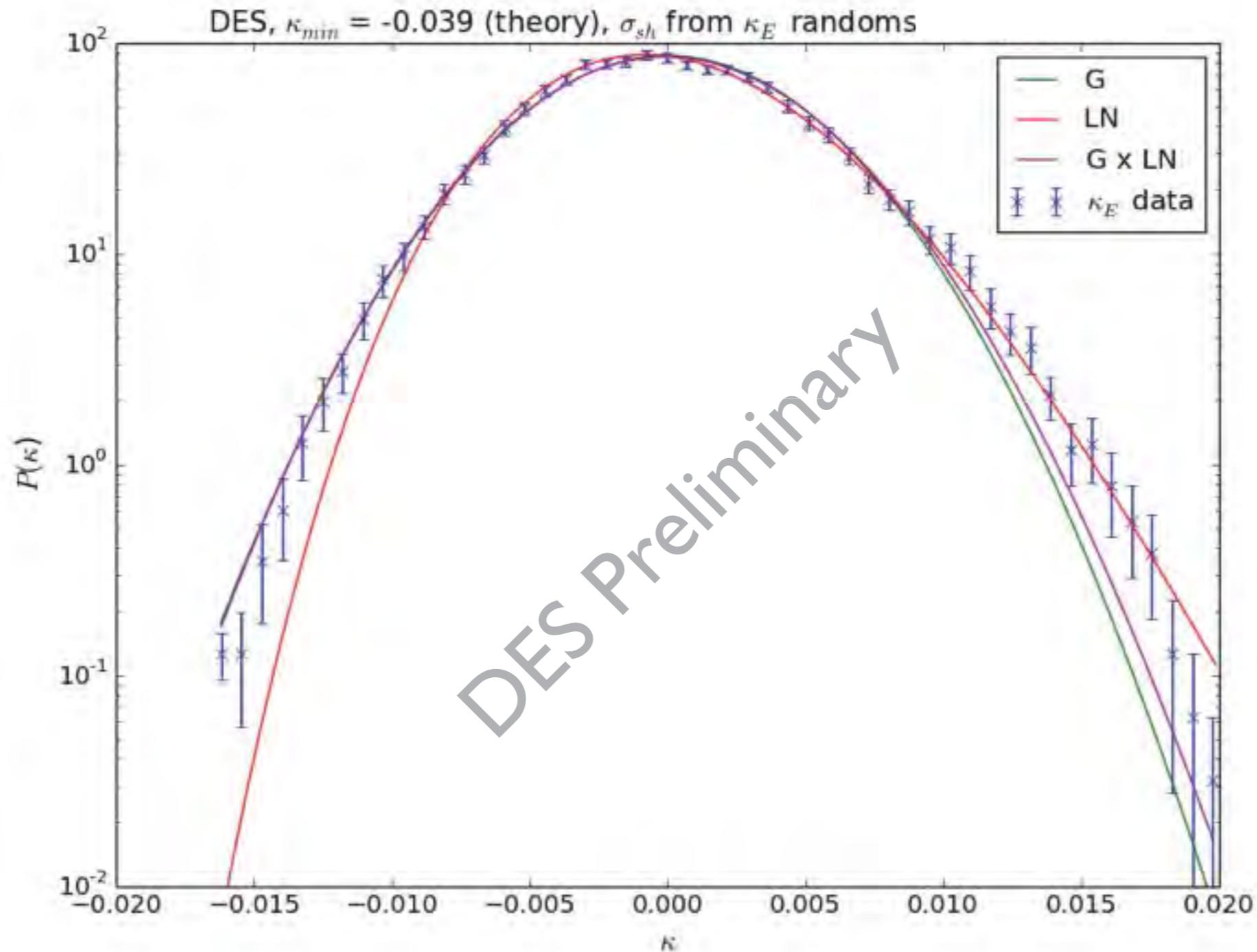
# Noise contribution to kappa



- The noise contribution to the kappa maps is evaluated from 100 realisations where the shear was randomised.
- Both kB and the mean of random kE maps give the same result. This is a test for observational systematics

$$P(\kappa) = \frac{1}{\sqrt{2\pi}\sigma} \int_{-1}^{\infty} \exp\left[-\frac{(\kappa - \kappa')^2}{2\sigma^2}\right] f(\kappa) d\kappa'$$

# Noise contribution to kappa

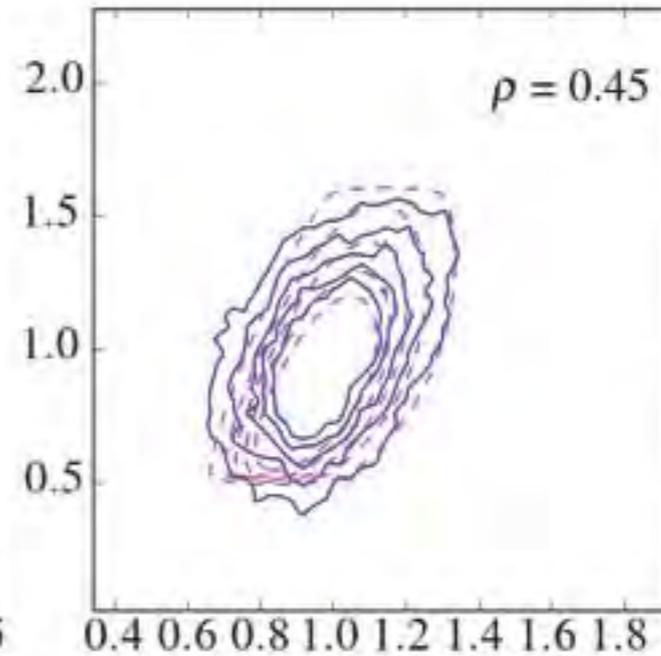
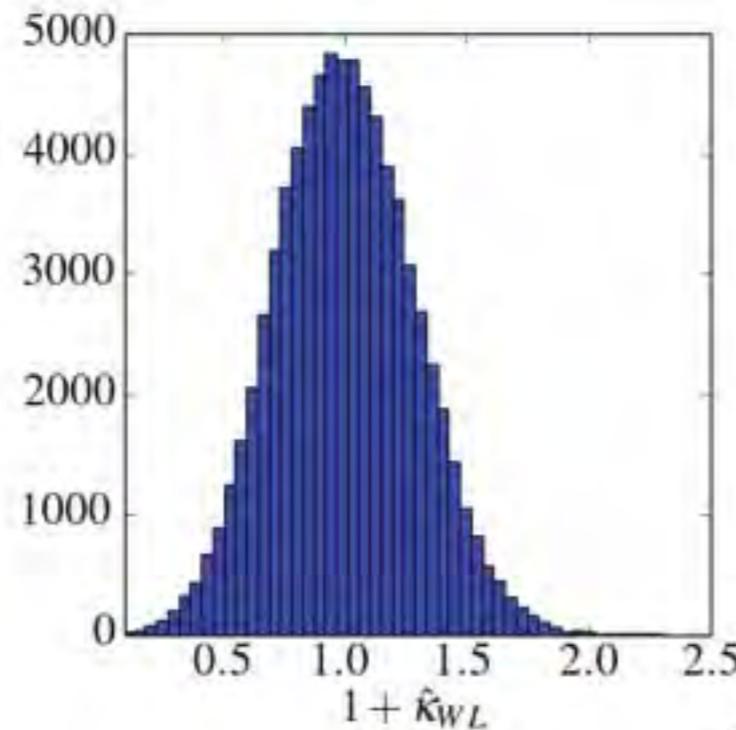


Clerkin, Kirk, MM, Lahav et al. (in prep)

# Log-normal fits

DES, 15 arcmin

DES Preliminary

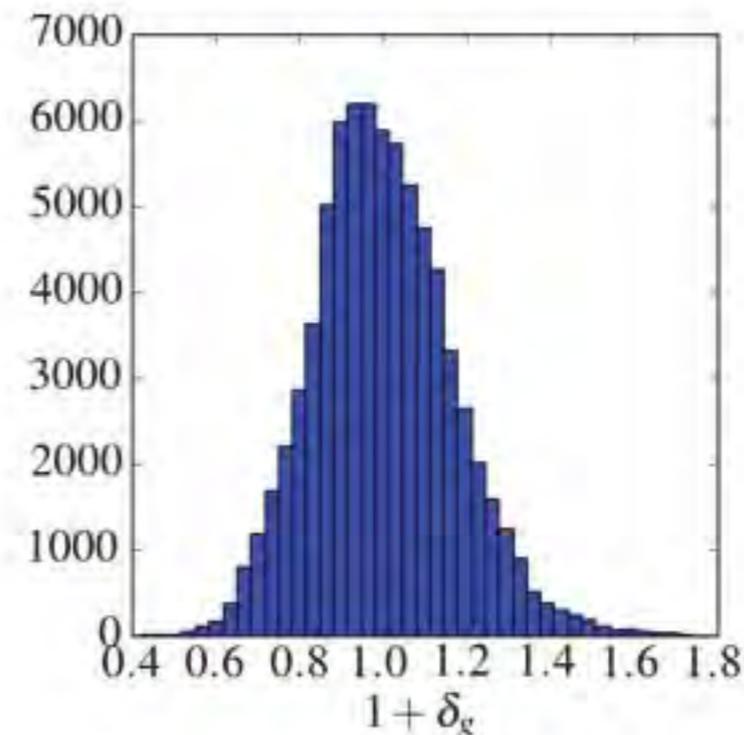


- We model the joint distribution as a bivariate log-normal.

$$g_g = \ln(1 + \delta) - \langle \ln(1 + \delta) \rangle$$

$$g_k = \ln(1 + \kappa/|\kappa_{min}|) - \langle \ln(1 + \kappa/|\kappa_{min}|) \rangle$$

Clerkin, Kirk, MM, Lahav et al. (in prep)



# Bias from different estimators

*The relationship between galaxies and the underlying field is a complex, non-local, non-linear, stochastic phenomenon that depends also on environment and history.*

$$\delta_g(x) = F[\delta(x)] = b_1 \delta(x) + \frac{1}{2} b_2 \delta_g^2(x) + \dots$$

simplification: linear and local bias  $\delta_g(x) = b\delta(x)$

## \* Bias from 1-point statistics : eg., lensing kappa

$$\kappa(\theta, r) = \frac{3H_0^2 \Omega_m}{r} \int_0^r dr' \frac{r'(r-r')}{r} \frac{\delta(\theta, r')}{a(r')} \quad \kappa_g(\theta, r) = \frac{3H_0^2 \Omega_m}{r} \int_0^r dr' \frac{r'(r-r')}{r} \frac{\delta_g(\theta, r')}{a(r')}$$

## \* Bias from 2-point statistics : eg., galaxy clustering

$$\xi_g(r) = \langle \delta_g \delta_g \rangle = b^2 \langle \delta \delta \rangle = b^2 \xi(r)$$

# Bias from different estimators

$$\delta_g(x) = F[\delta(x)] = b_1 \delta(x) + \frac{1}{2} b_2 \delta_g^2(x) + \dots$$

simplification: linear bias  $\delta_g(x) = b\delta(x)$

Bias from comparing lensing and galaxies integrated on the line of sight:

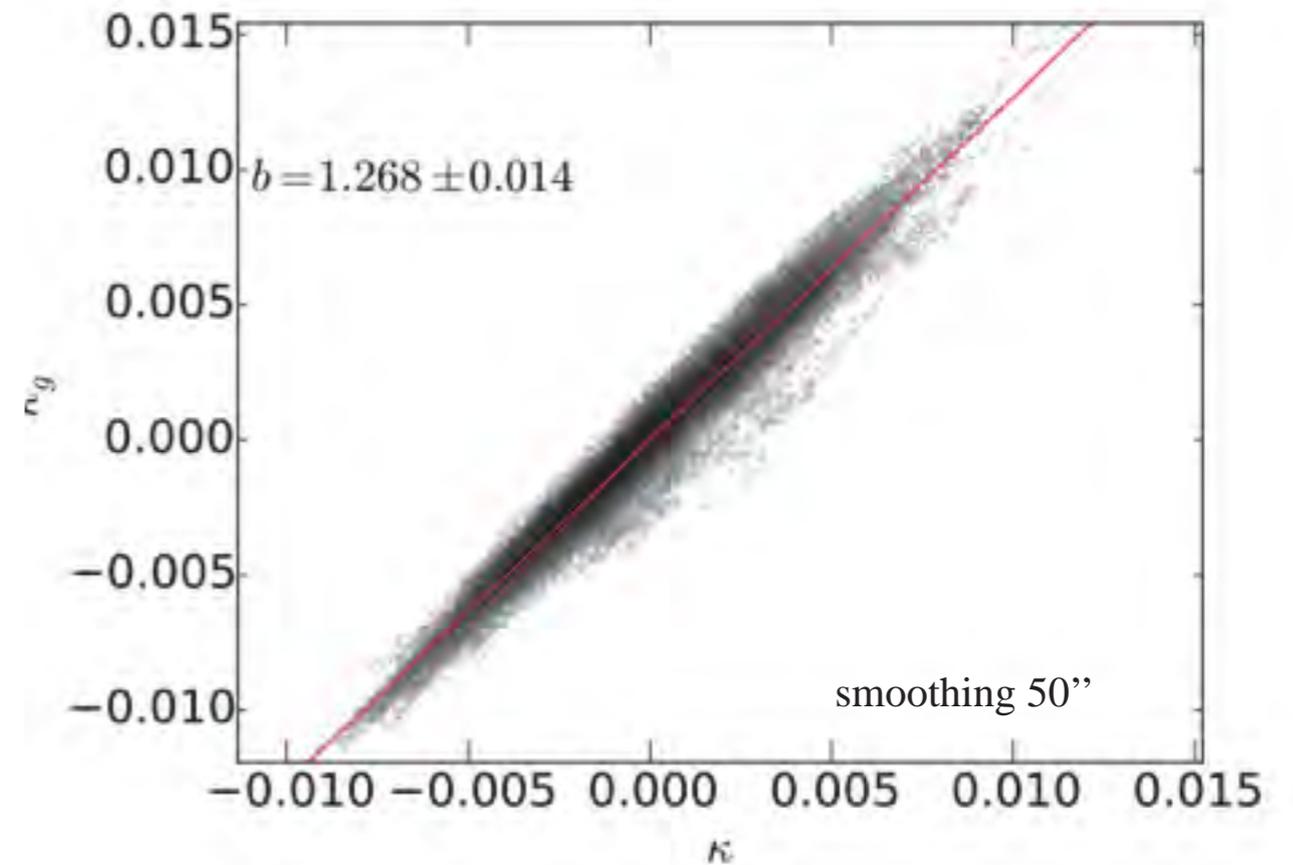
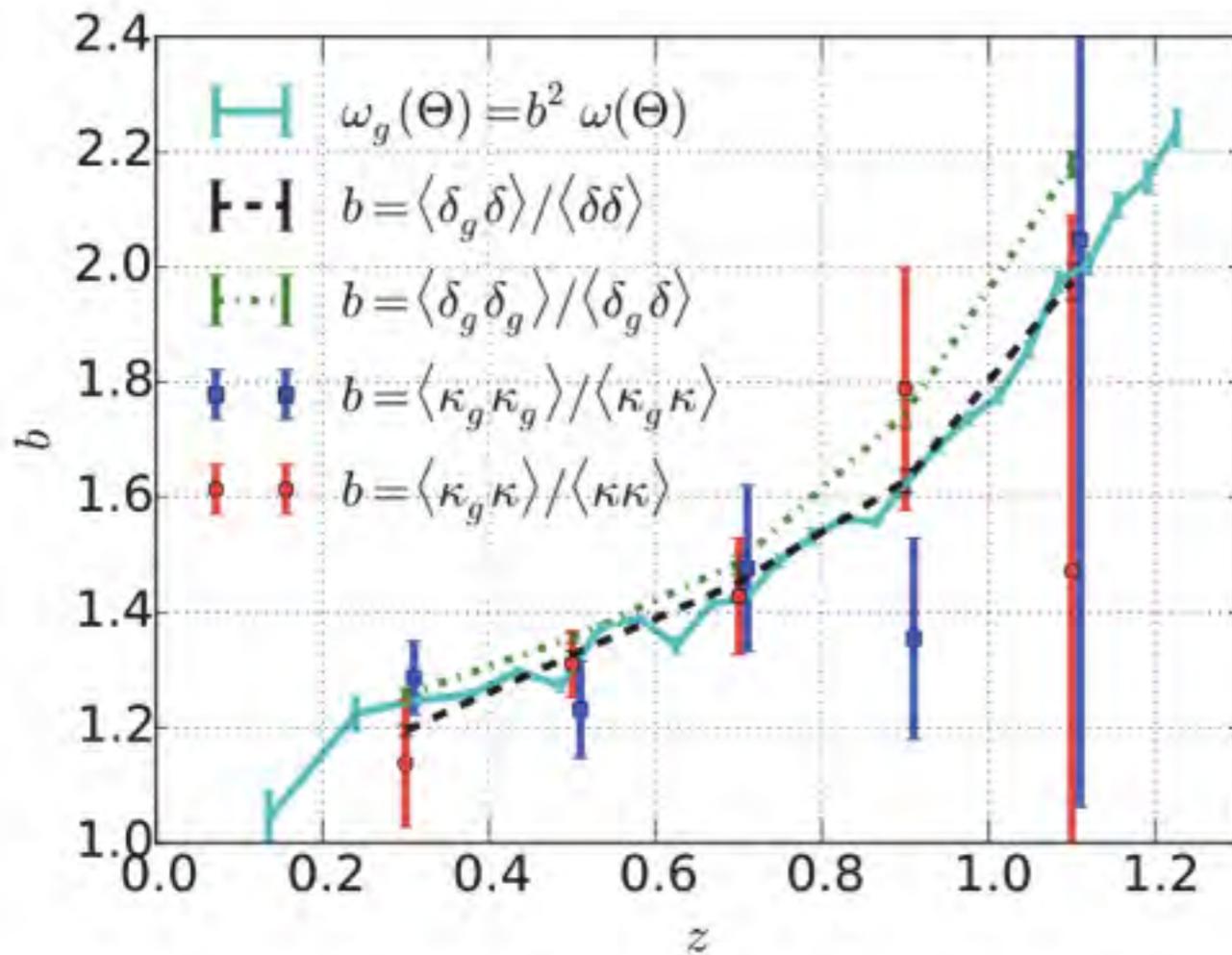
$$\kappa(\theta, r) = \frac{3H_0^2 \Omega_m}{r} \int_0^r dr' \frac{r'(r-r')}{r} \frac{\delta(\theta, r')}{a(r')}$$

$$\kappa_g(\theta, r) = \frac{3H_0^2 \Omega_m}{r} \int_0^r dr' \frac{r'(r-r')}{r} \frac{\delta_g(\theta, r')}{a(r')}$$

Bias from correlation of galaxies comparing with theory

$$\xi_g(r) = \langle \delta_g \delta_g \rangle = b^2 \langle \delta \delta \rangle = b^2 \xi(r) \quad w_g(\theta) = b^2 w(\theta)$$

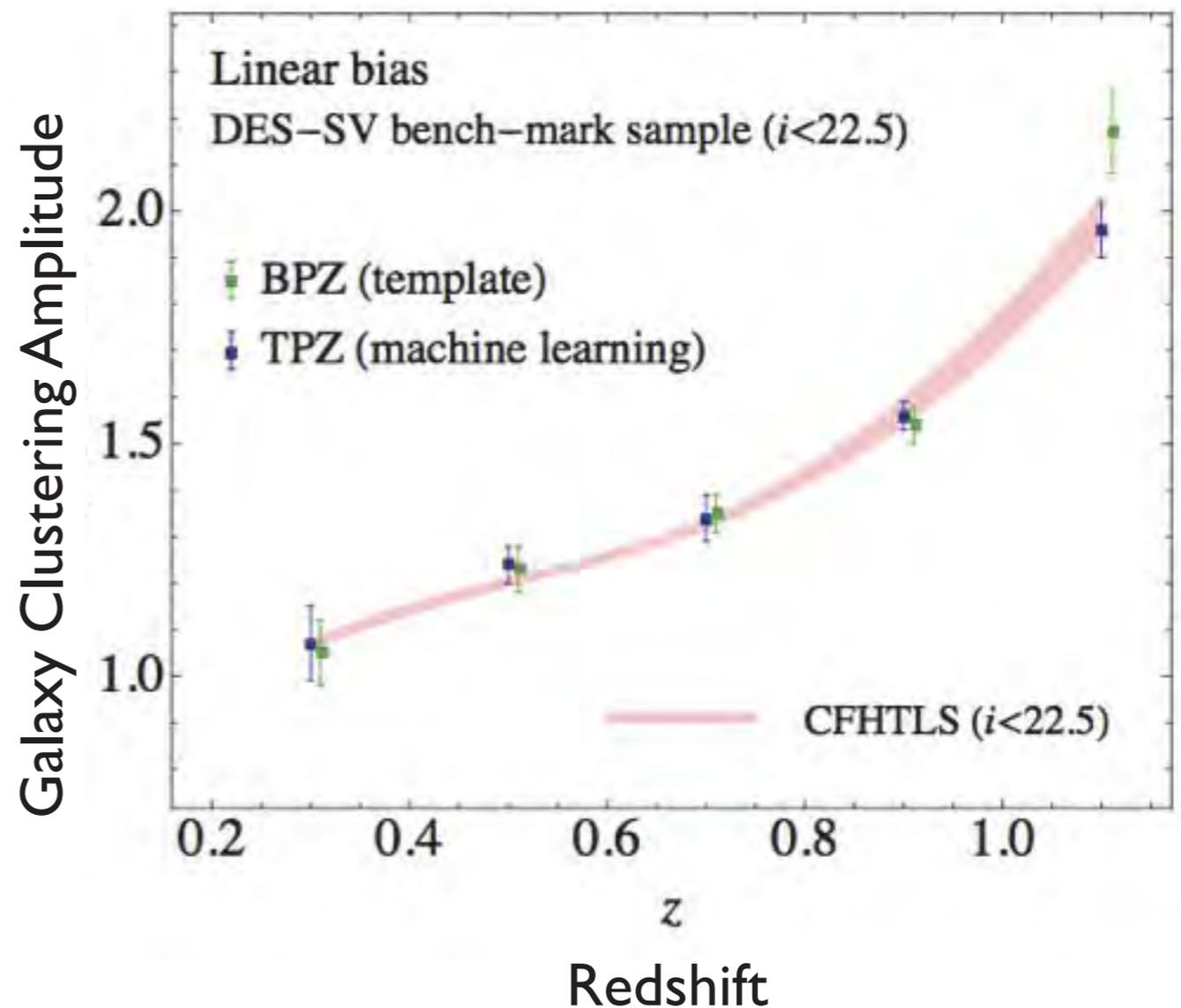
# Bias from simulations



Pujol et al. 2015 arXiv:1601.00160

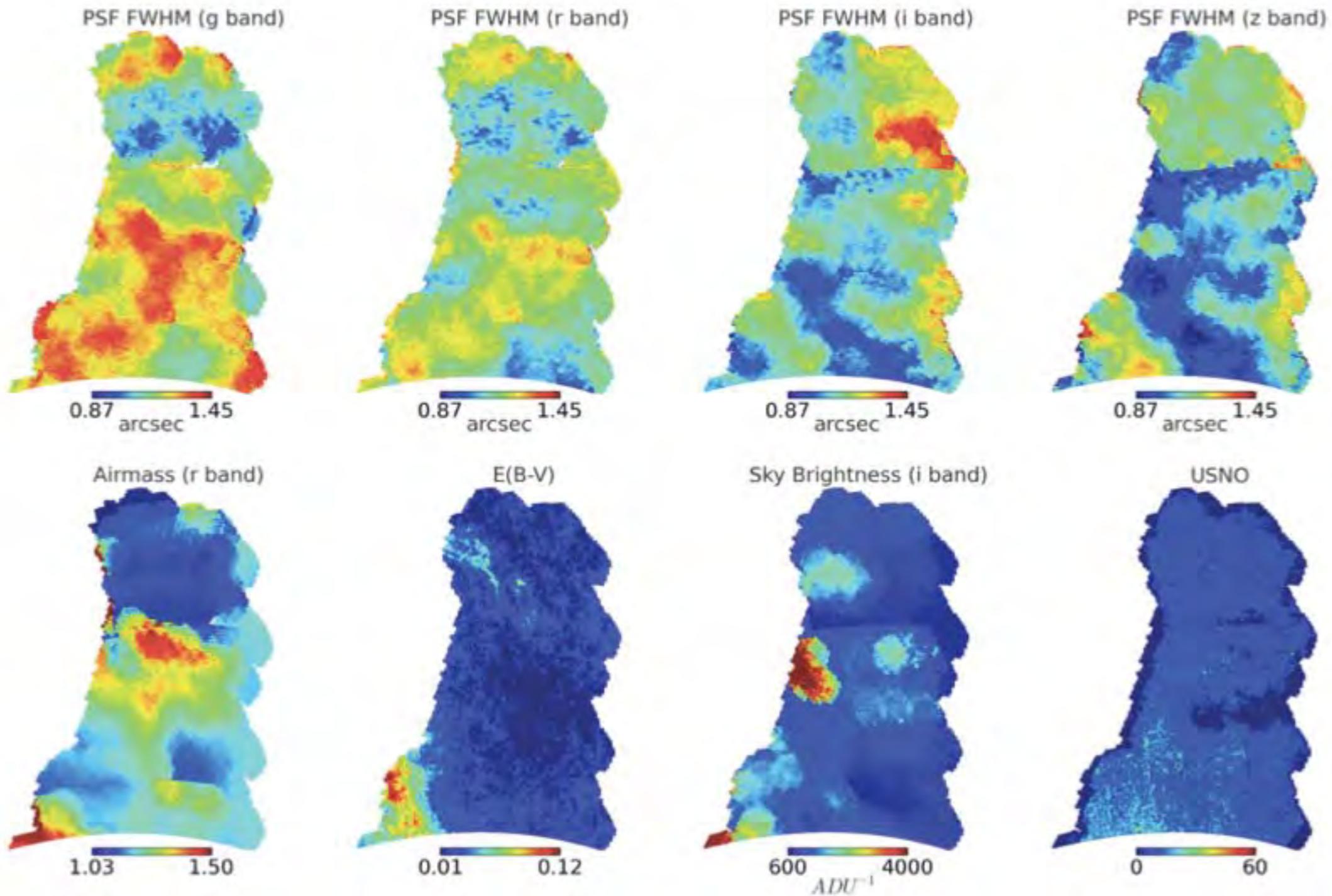
# Bias from 2-point correlation

- ◆ Clustering measured in Science Verification data ( $\sim 130 \text{ deg}^2$ )
- ◆ Compares well to state of the art at same sensitivity
- ◆ (Thorough investigation of systematics)



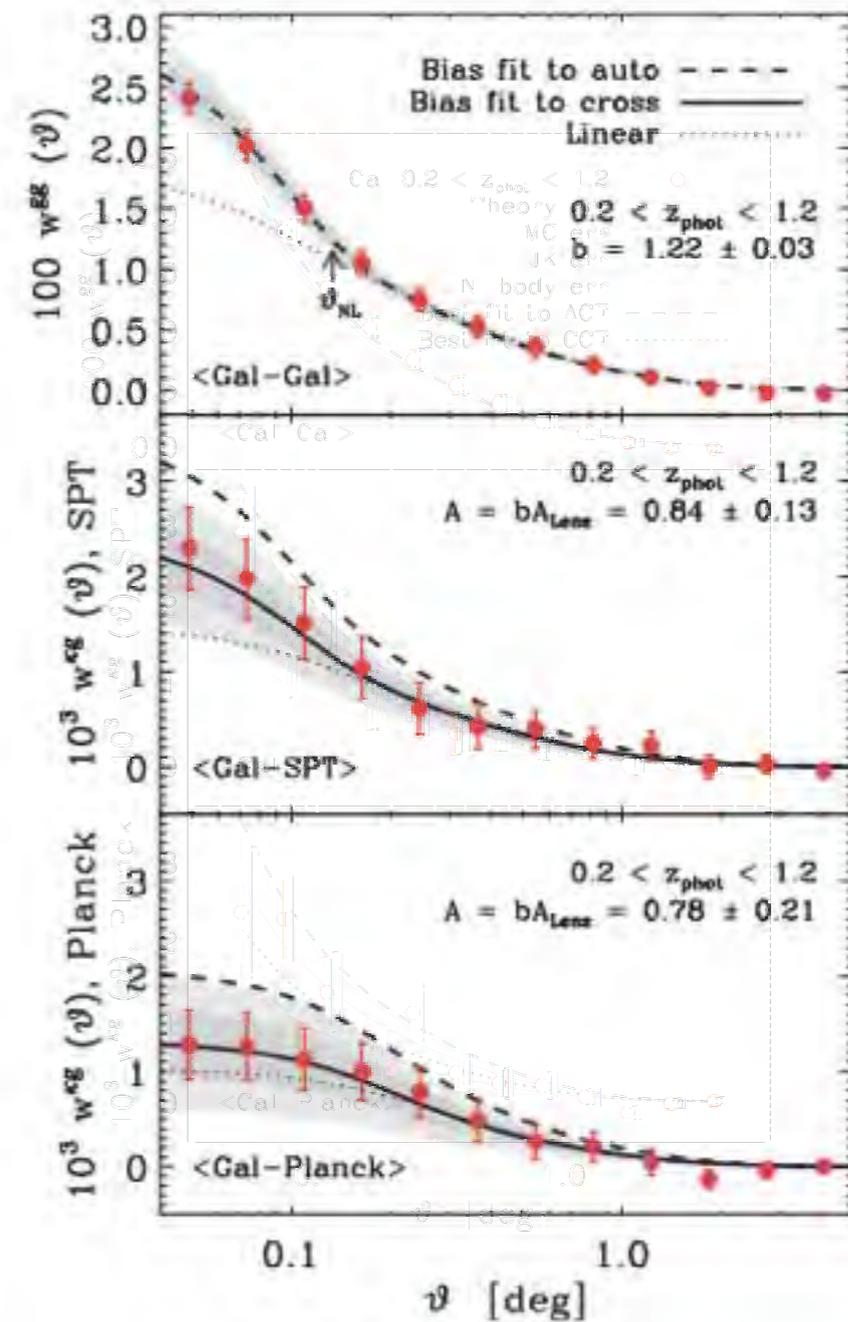
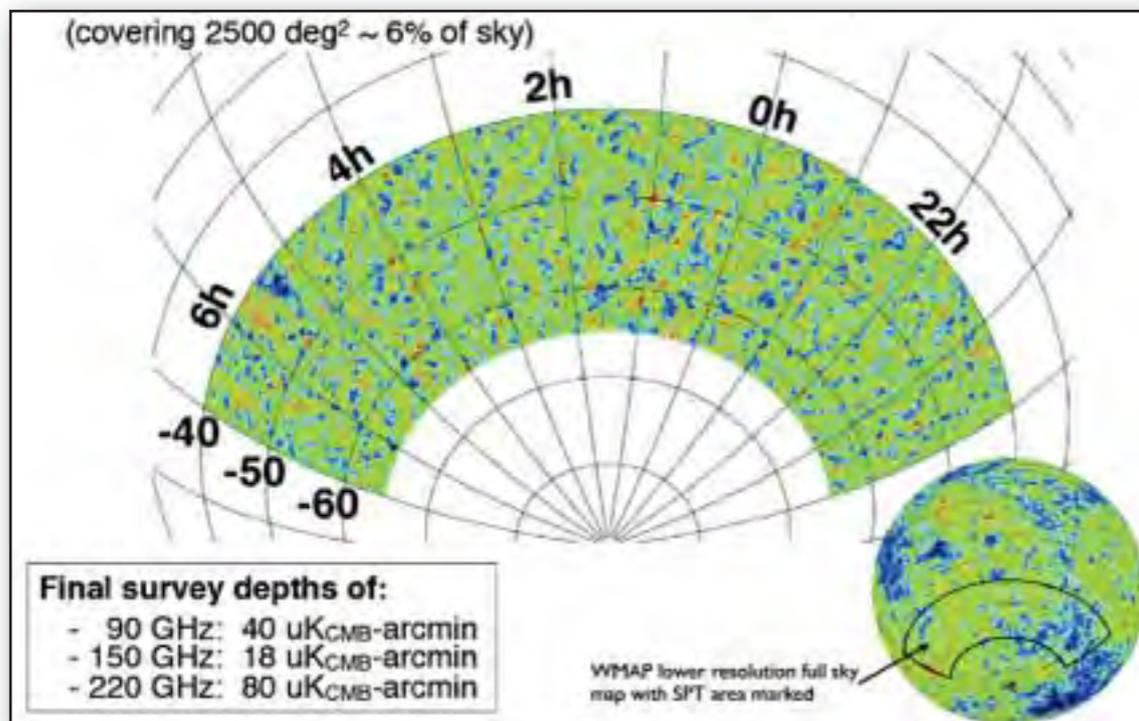
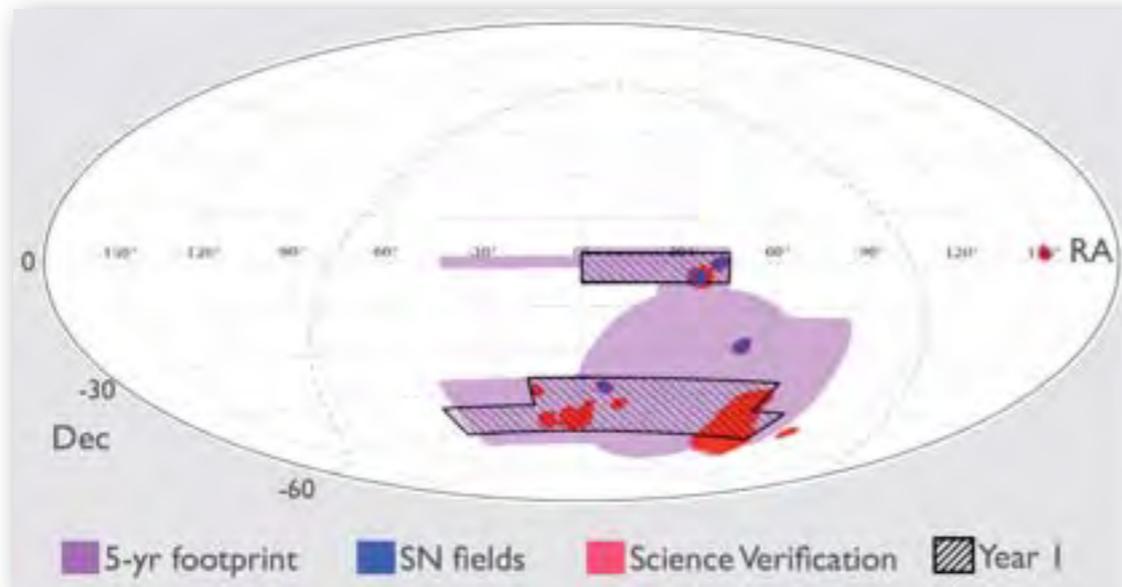
Crocce et al. 2015 MNRAS 455

# Systematics



Crocce et al. (2015), Leisted et al. (2015) Suchyta et al. (2015)

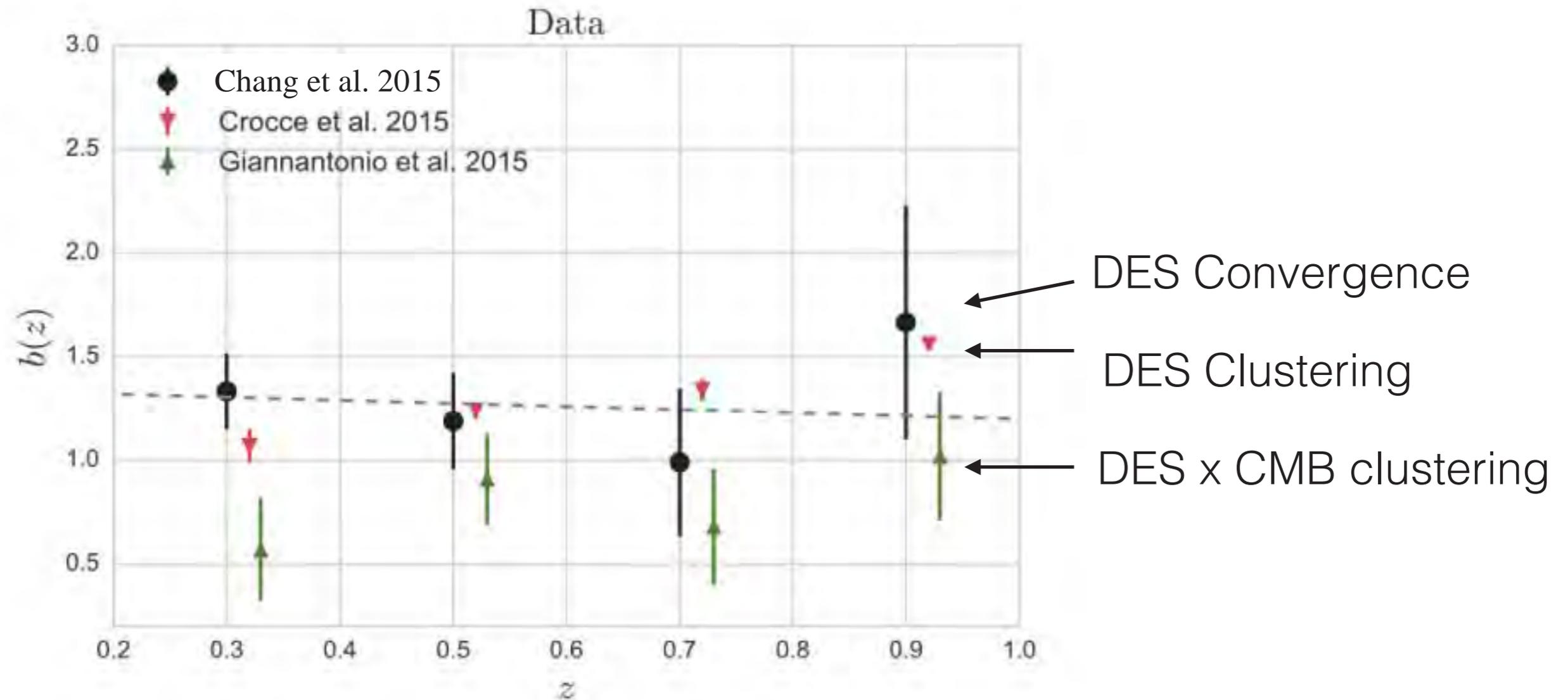
# Bias from CMB x DES



Giannantonio, Fosalba 2016 MNRAS 456

(also evolution in redshift)

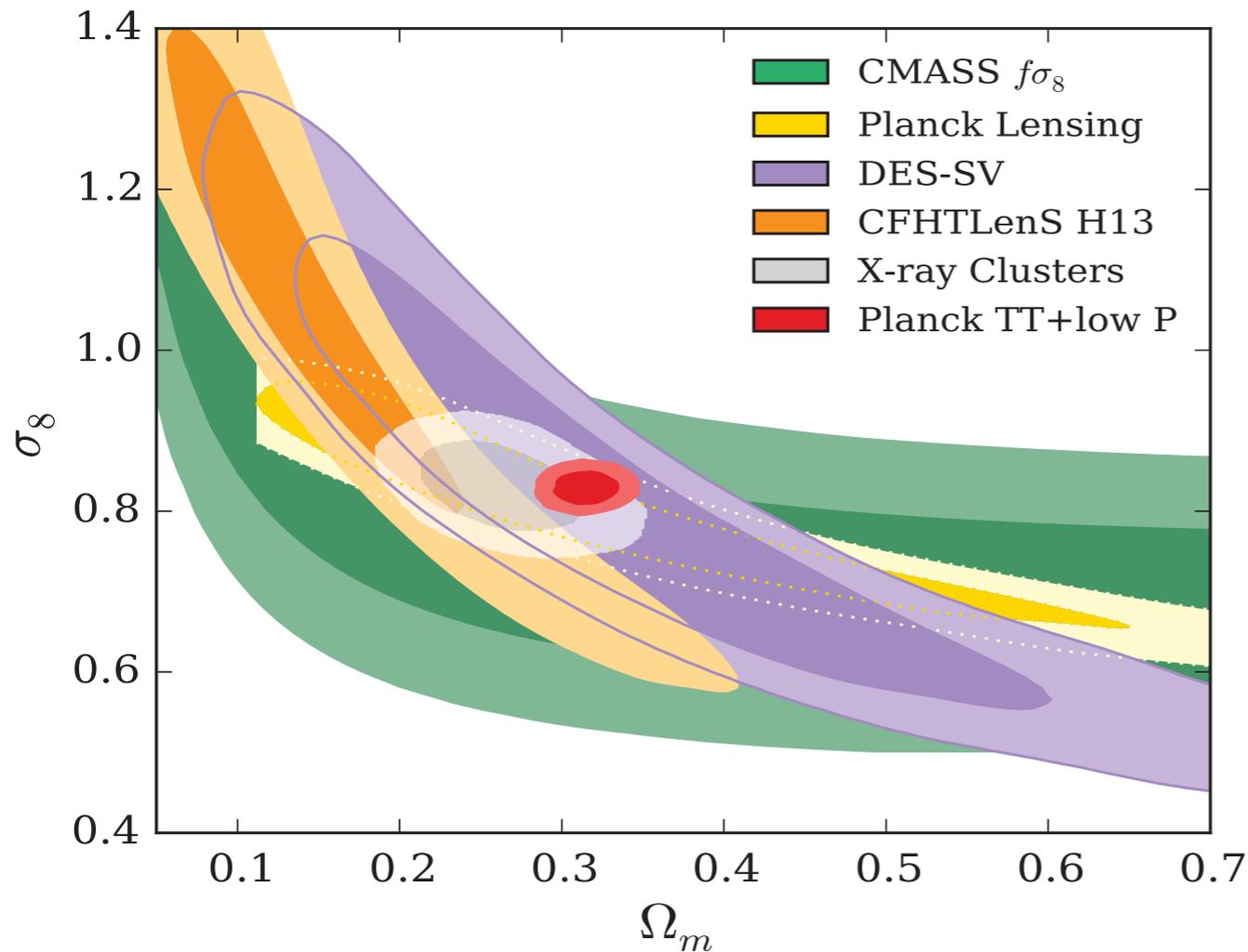
# Bias comparison



Chang et al. 2016 arXiv:1601.00450

Only with SV Data

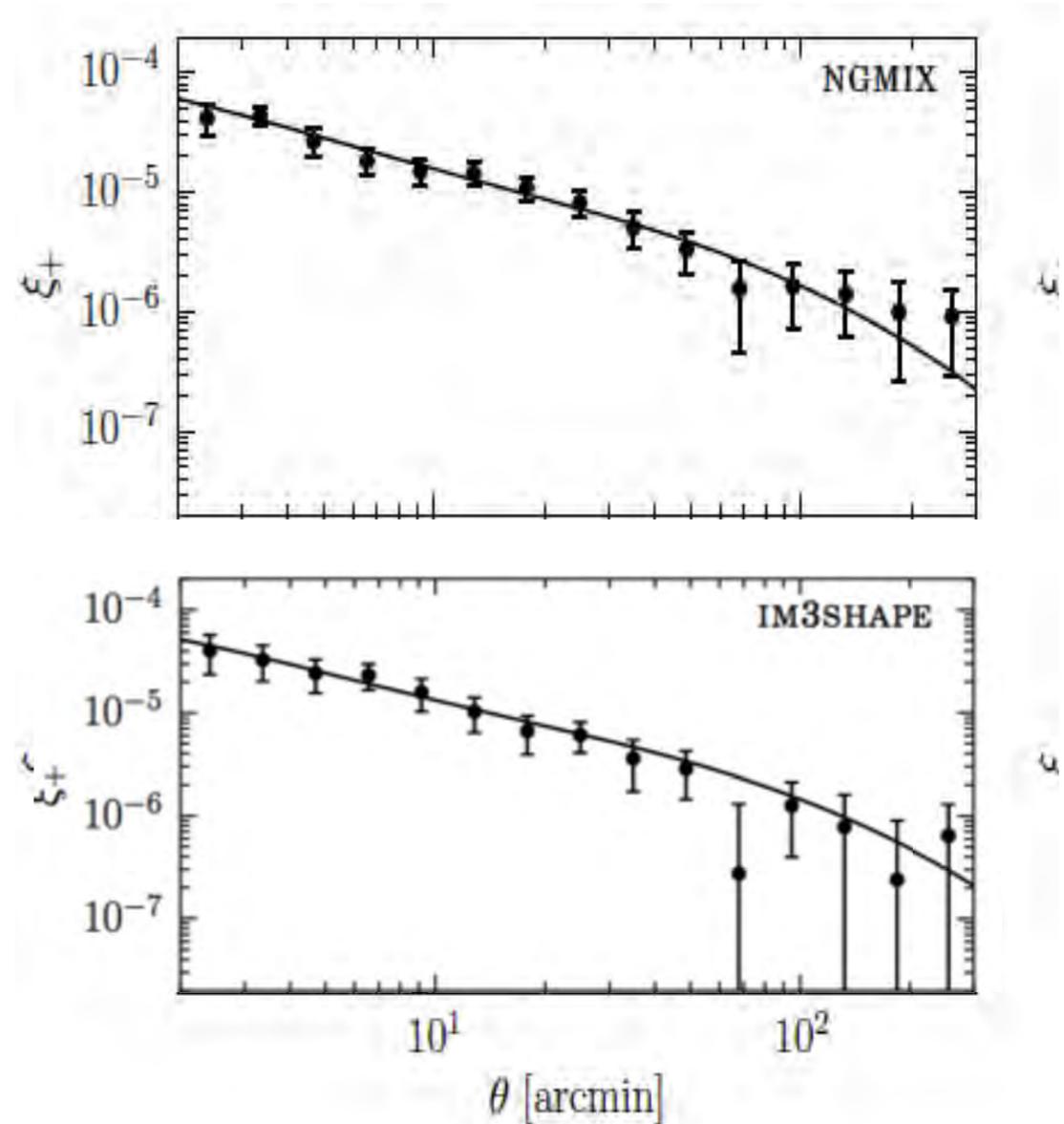
# Cosmology with WL-2pf



Cosmological parameters

\*The DES collaboration  
(Bridle, McCrann, Zunz et al.)

Becker et al. *astroph* 2015,  
Jarvis et al. *arXiv* 2015

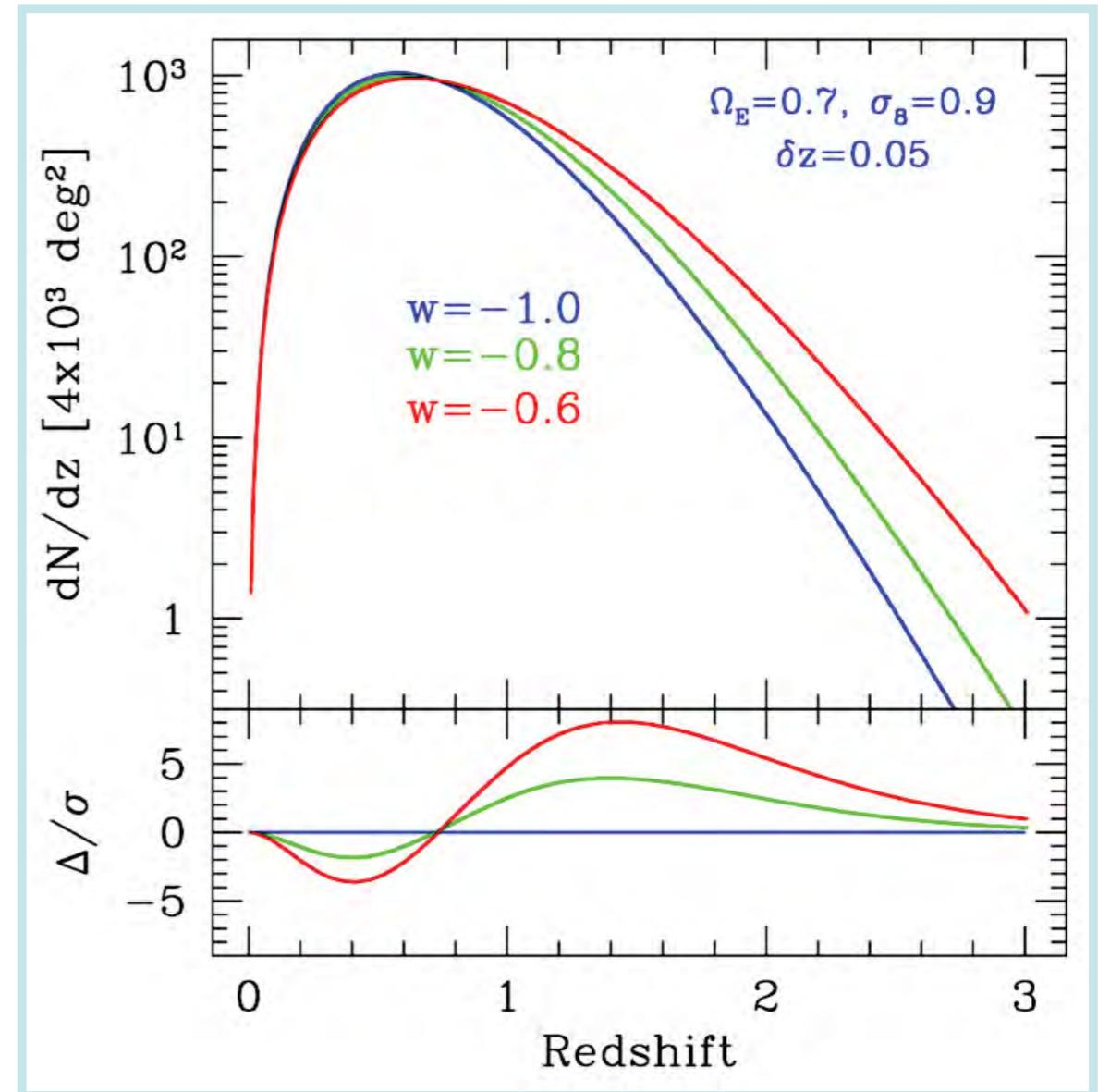


2pt xi (+-) from two shear pipelines

# Clusters



- ◆ Number of clusters as function of redshift sensitive to DE
- ◆ Accurate Mass calibration and redshift determination is vital

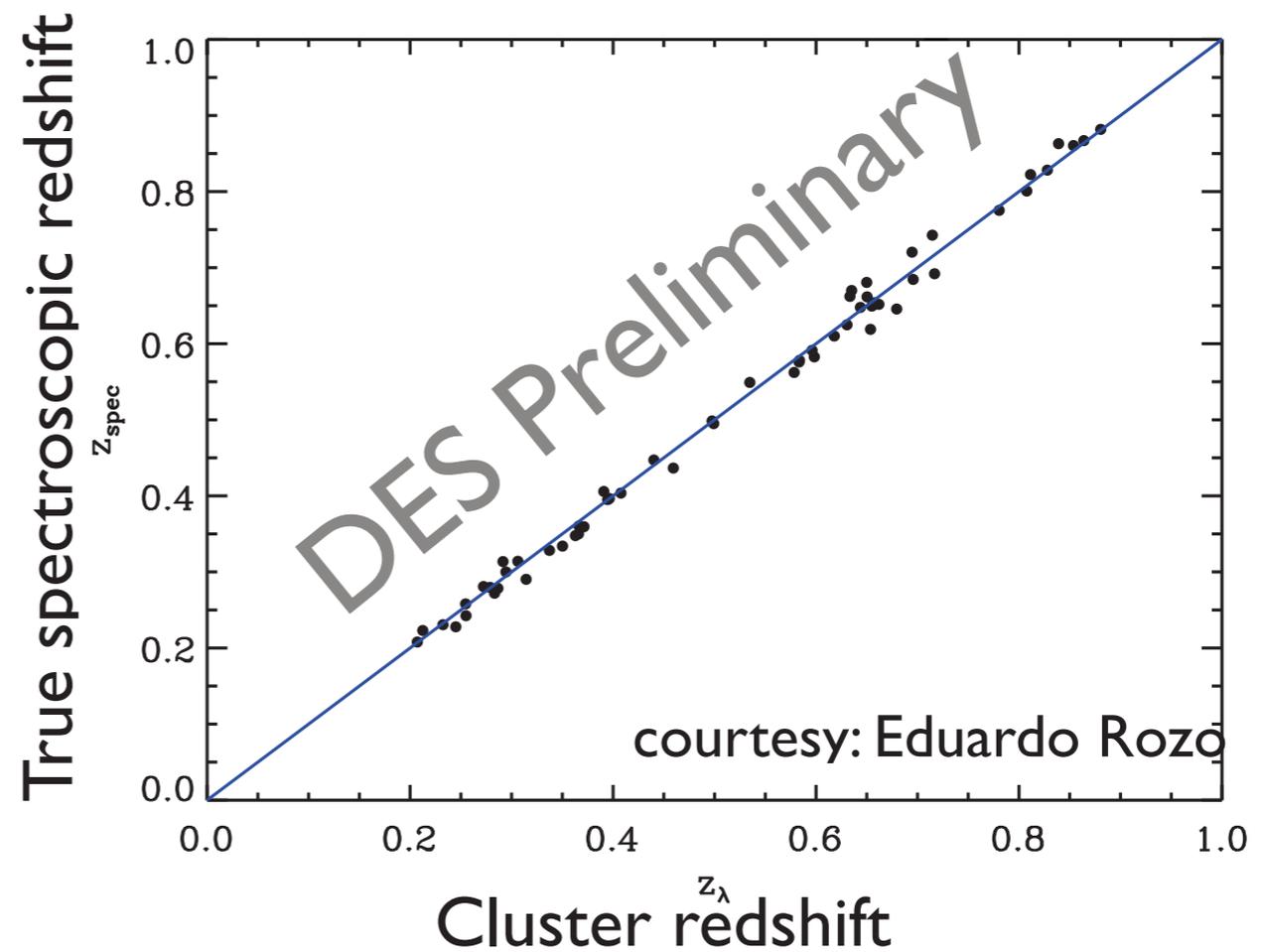
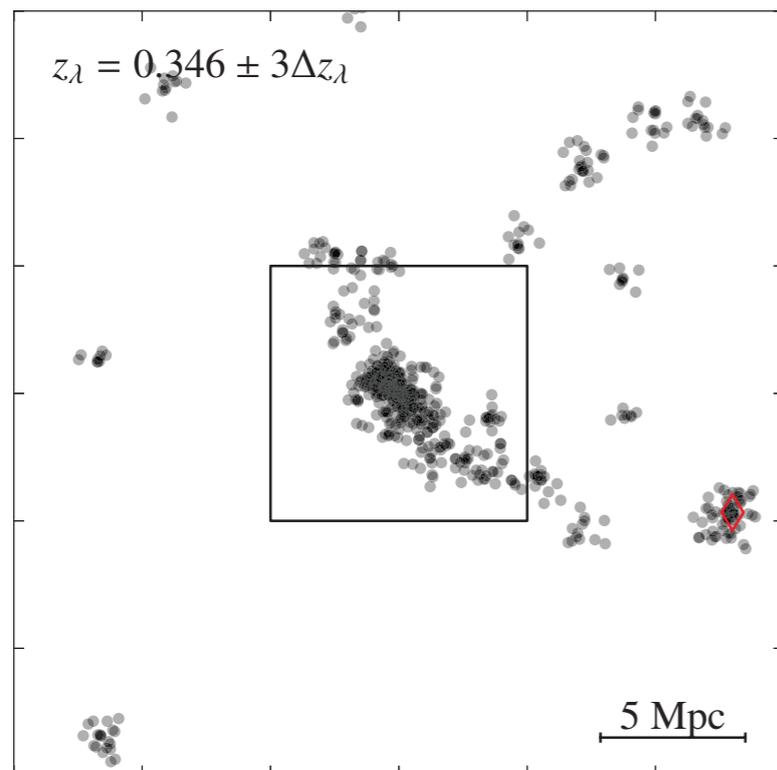


Number of clusters above  $10^{14.5}$  solar masses, for a  $4000 \text{ deg}^2$  survey

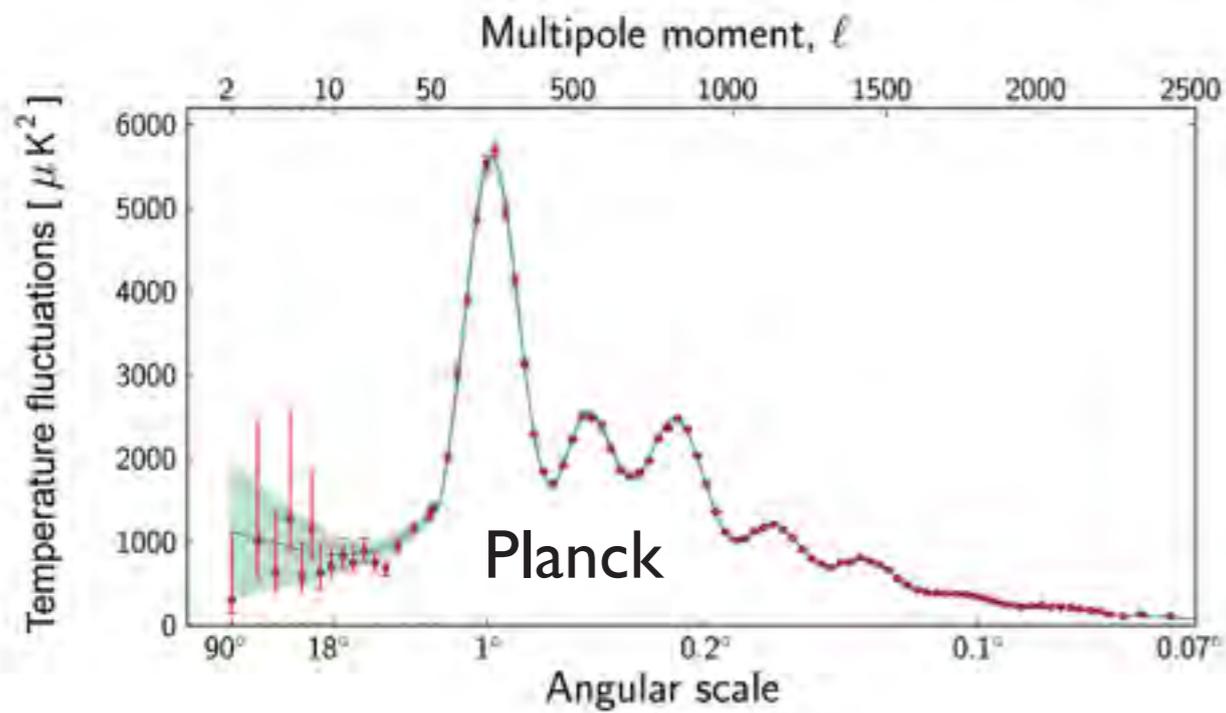
# DES Clusters: redshift calibration



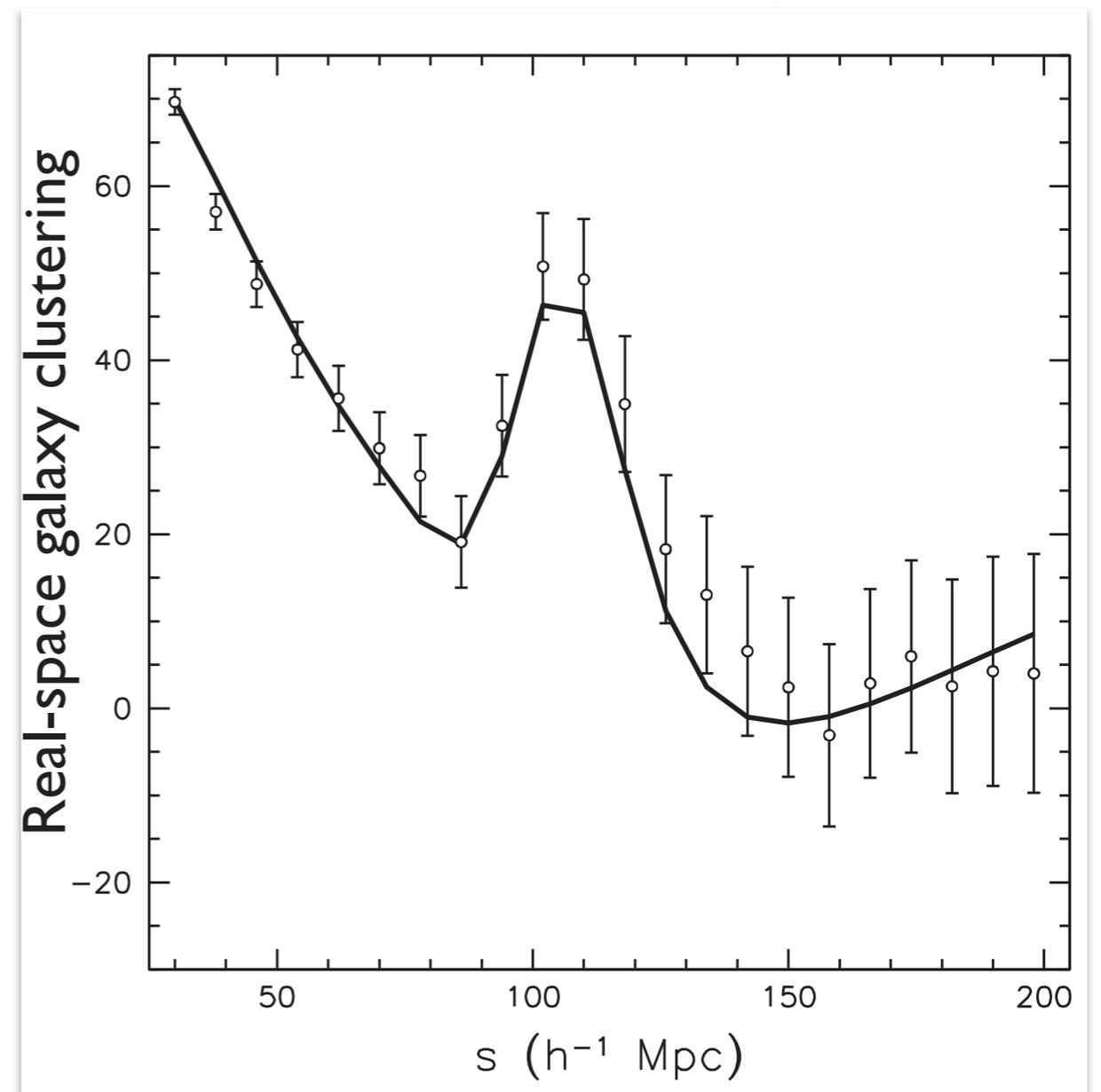
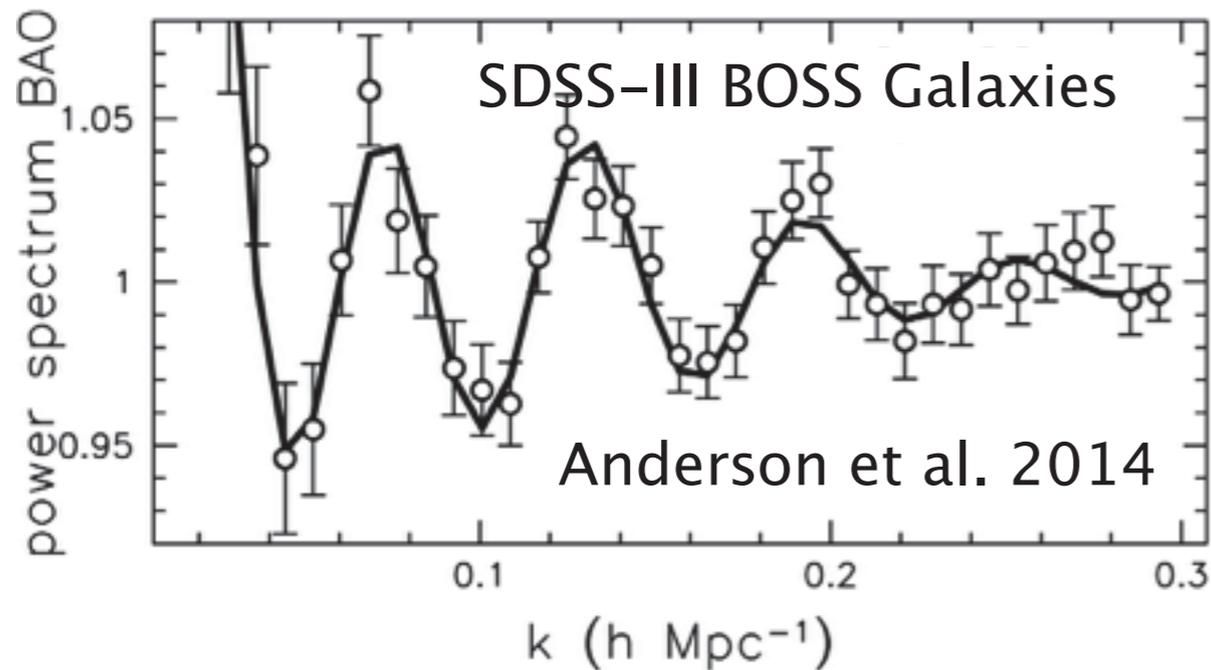
- ◆ 1% redshift accuracy
- ◆ Cluster cosmology should follow once we complete mass calibration



# Large Scale Structure



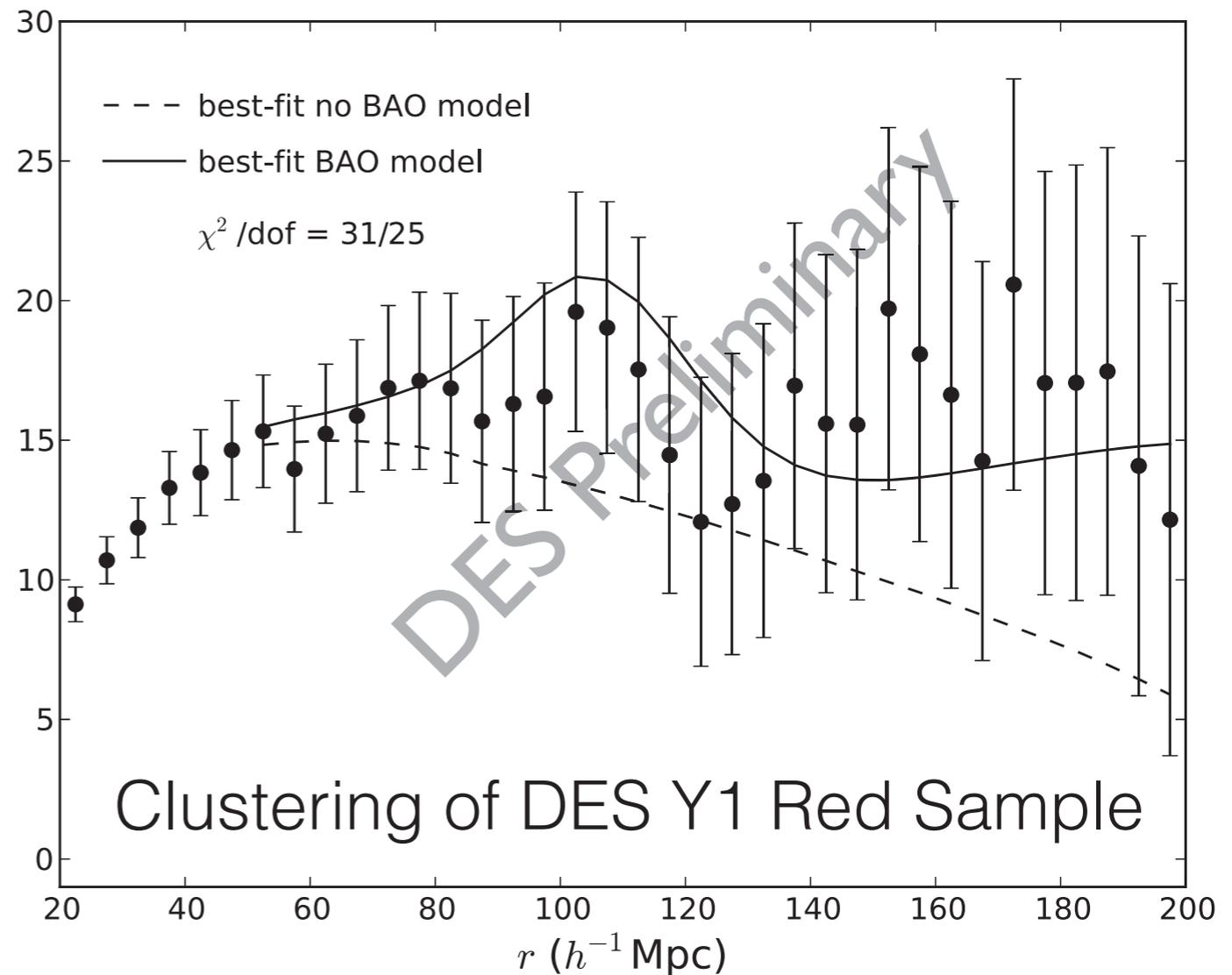
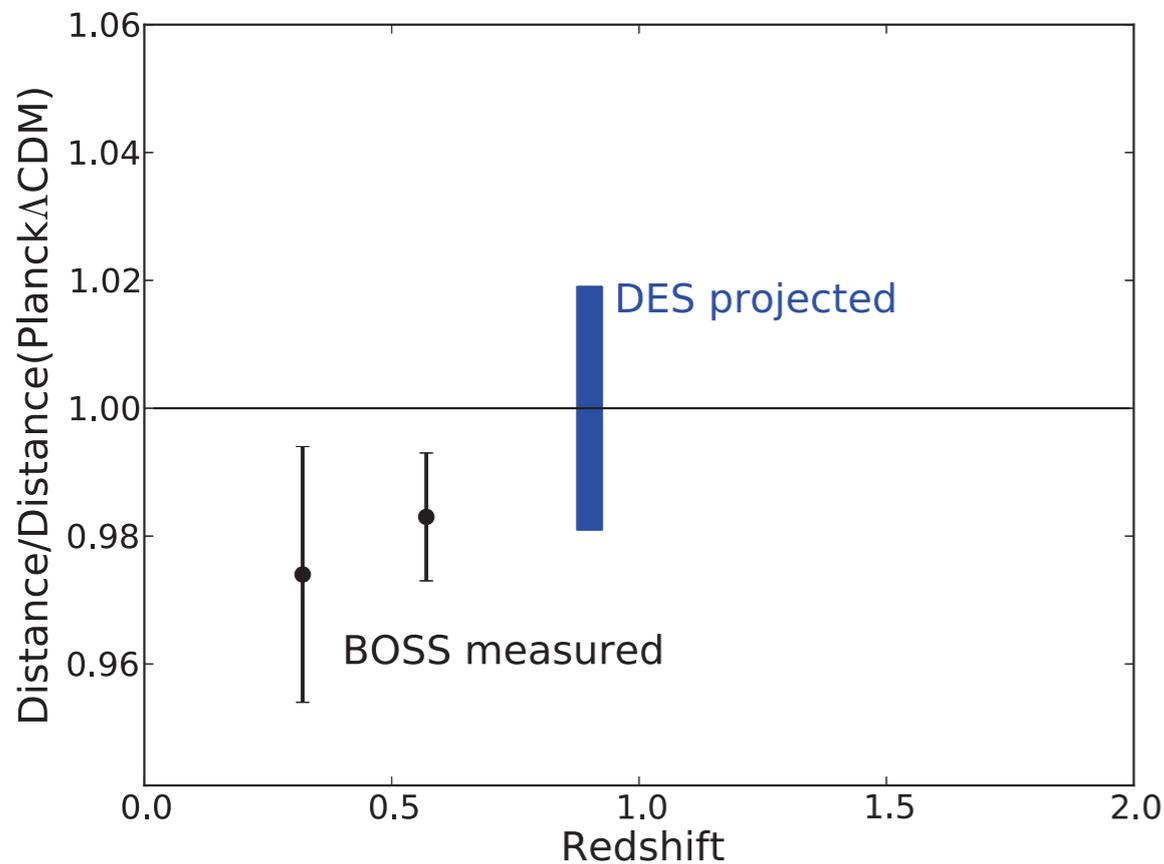
- ◆ baryon acoustic oscillation feature gives “standard ruler”, calibrated by CMB



# Large Scale Structure



## ◆ BAO extrapolation based on current data:



- ◆ Very preliminary
- ◆ Very encouraging

- ◆ Plot: 3D clustering, weighted heavily to transverse pairs
- ◆ Yielding better than 4% BAO measurement

Credit: Ashley Ross

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- ◆ Dark Energy Science

  - Weak lensing

  - Galaxy clusters

  - Large-Scale Structure

  - Supernovae

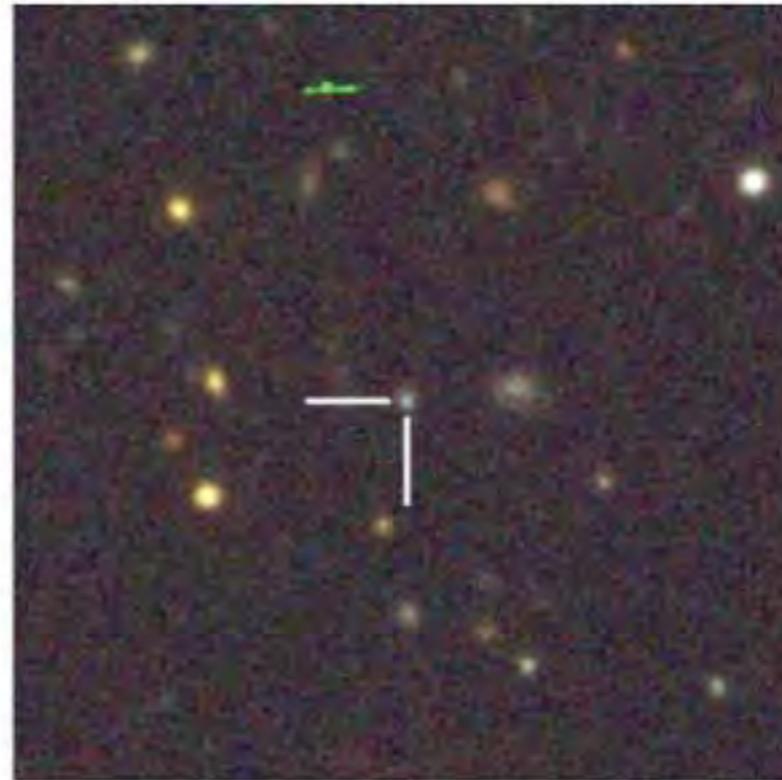
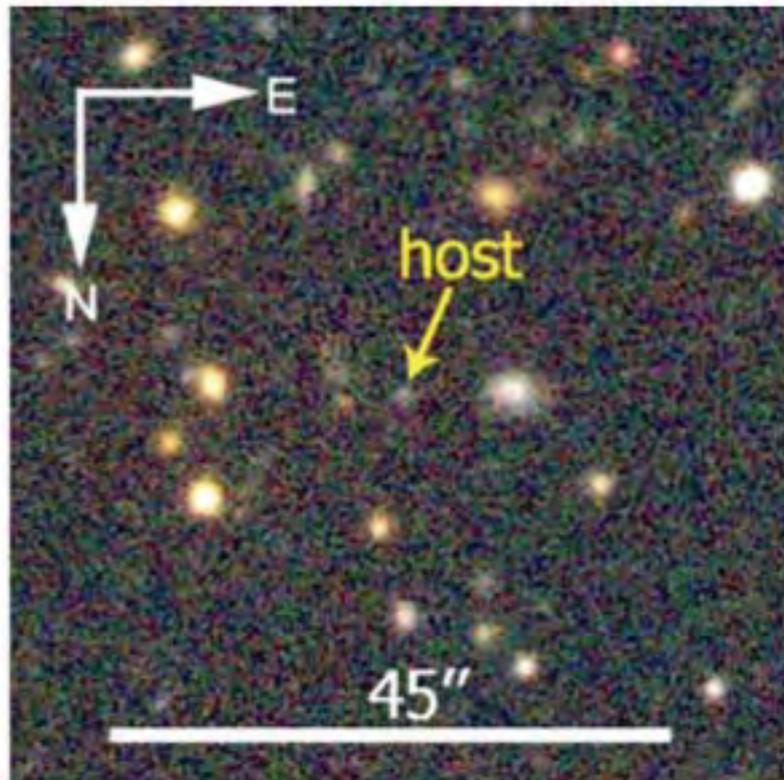
- ◆ non Dark Energy Science

  - Discoveries!

# Results from Science Verification Data: SuperLuminous SuperNova



DES13S2cmm



- SLSN are 50 times brighter than typical SN.
- SLSN are rare objects. Only 14 are observed as well as this one.
- Spectroscopically confirmed SLSN with  $z = 0.663 \pm 0.001$
- Located in a faint, low metallicity, low stellar-mass host galaxy.

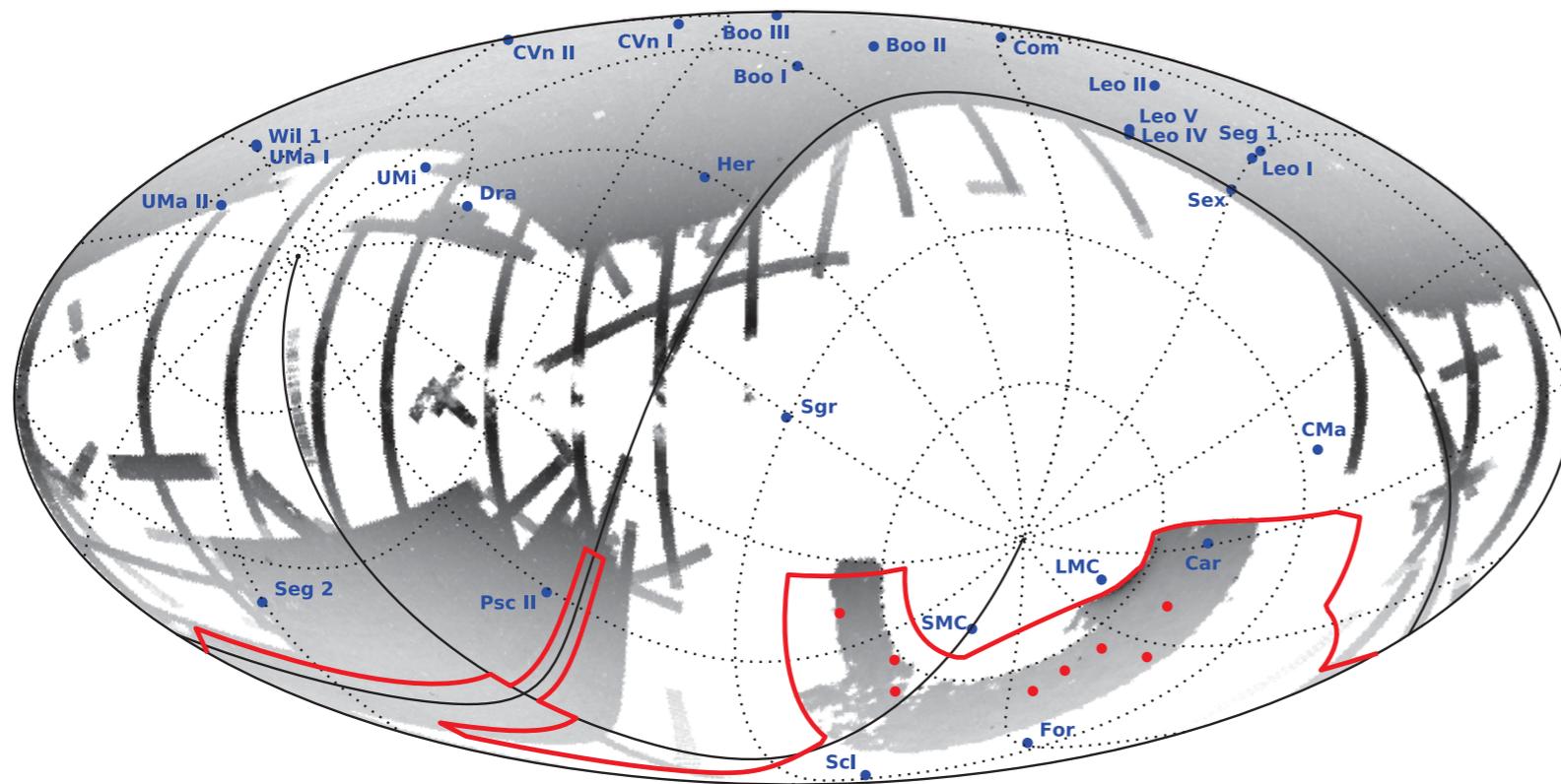
# Milky Way Satellites



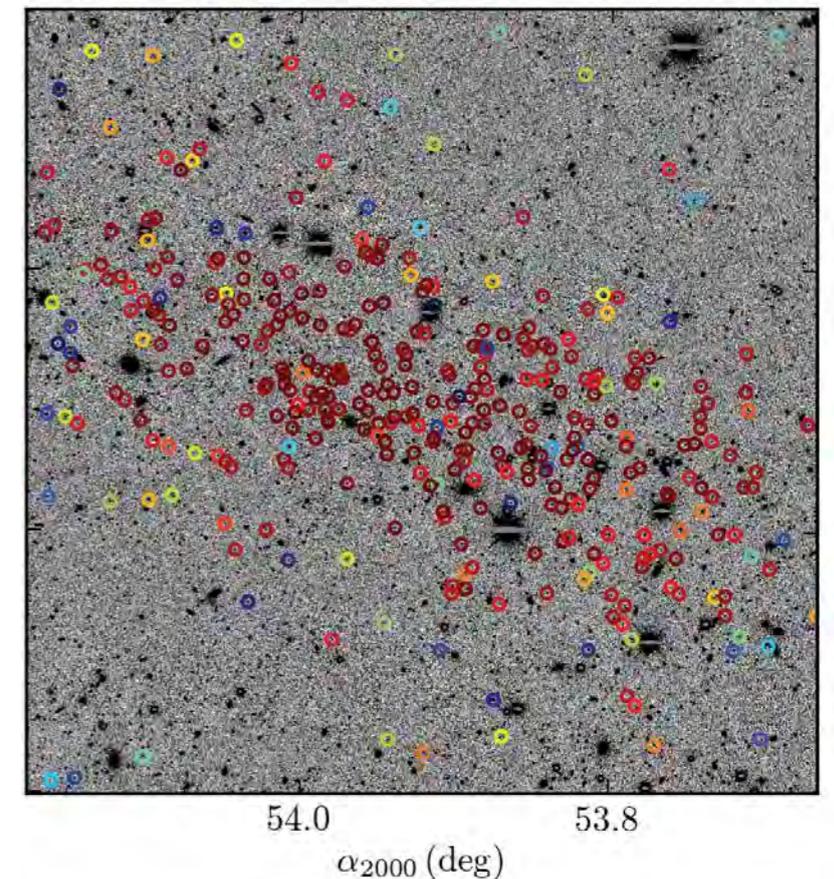
Bechtol et al. (2015)

◆ 8 new dwarf satellites!

## Locations of Milky Way Satellites



DES J335.6



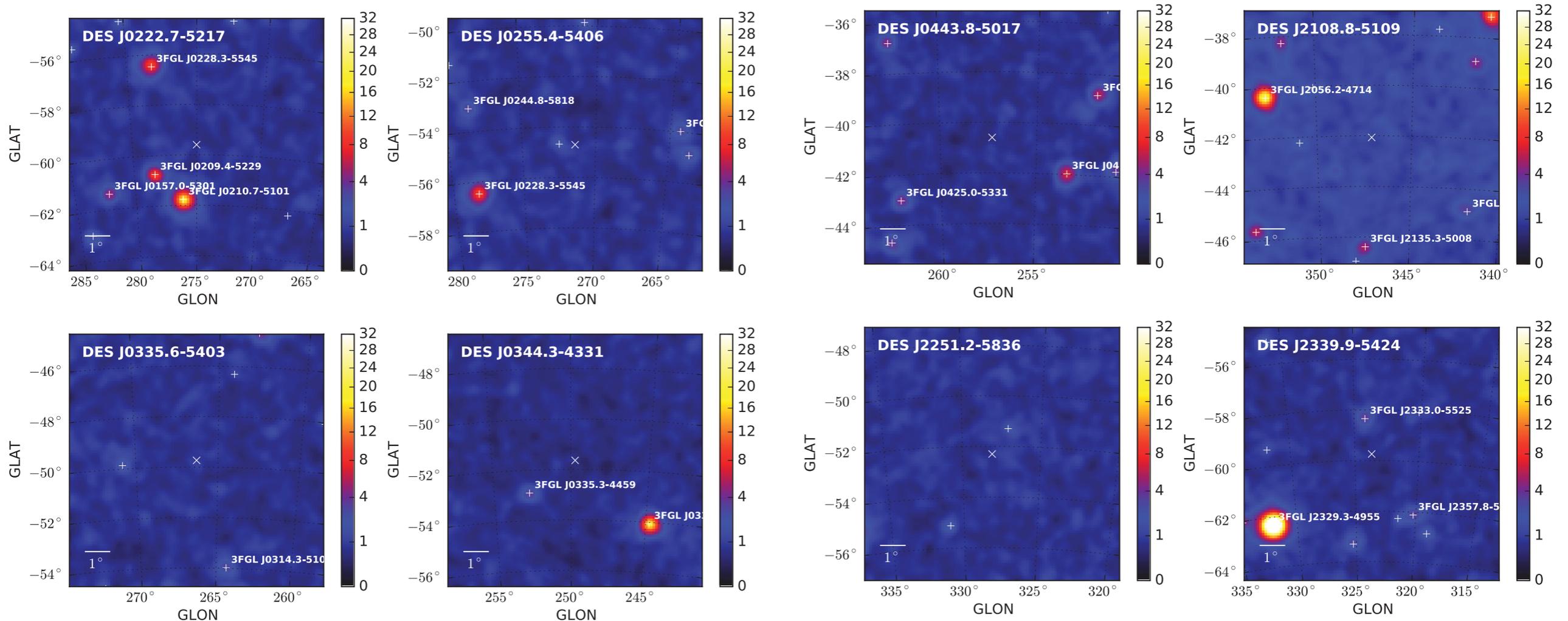
- From 1,800 deg<sup>2</sup> of optical imaging data (DES 1st year)
- Identified as statistically significant overdensity of stars

# Milky Way Satellites



Drlica-Wagner et al. (2015)

- ◆ DES+Fermi LAT collaboration
- ◆ No detection of dark matter annihilation signature in gamma rays



# OUTLINE

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- Motivation
- The Dark Energy Survey  
& First Results
- Mock Galaxy Catalogues

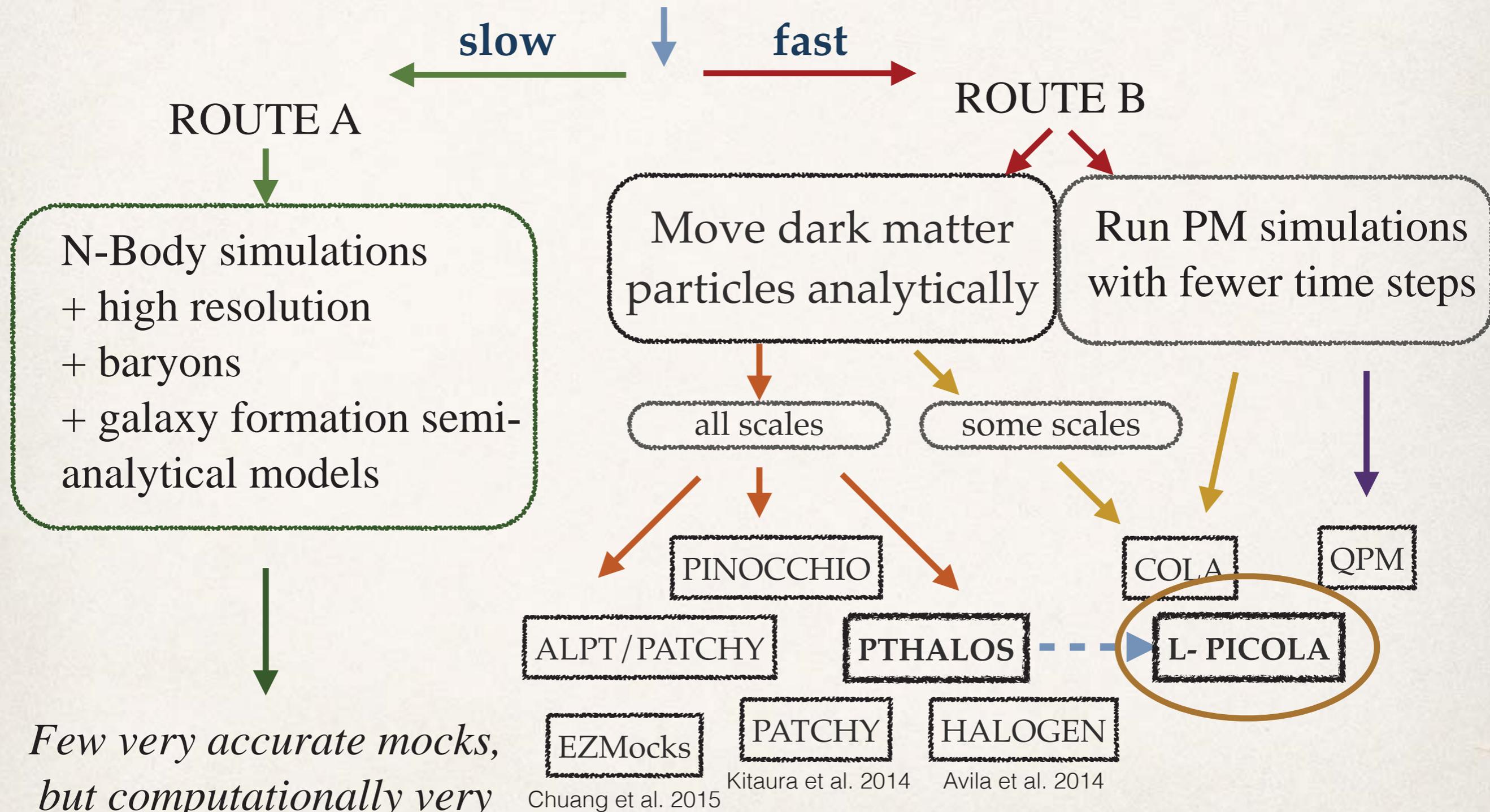
# Why Mock Galaxy Catalogues?

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- ❖ *Testing your pipelines*
- ❖ *Understanding Errors*
- ❖ *Computing covariances*

- *You know what has been included in the mocks, so one can work out what are the best estimators, and test systematics.*
- *As pipelines become complex they are more difficult to capture by theoretical modelling, and mocks are needed.*
- *Covariance matrix require a large number of realisations, the production of fast mock galaxy catalogues may provide them*
- *Large number of mocks allows for exploration of the parameter space.*

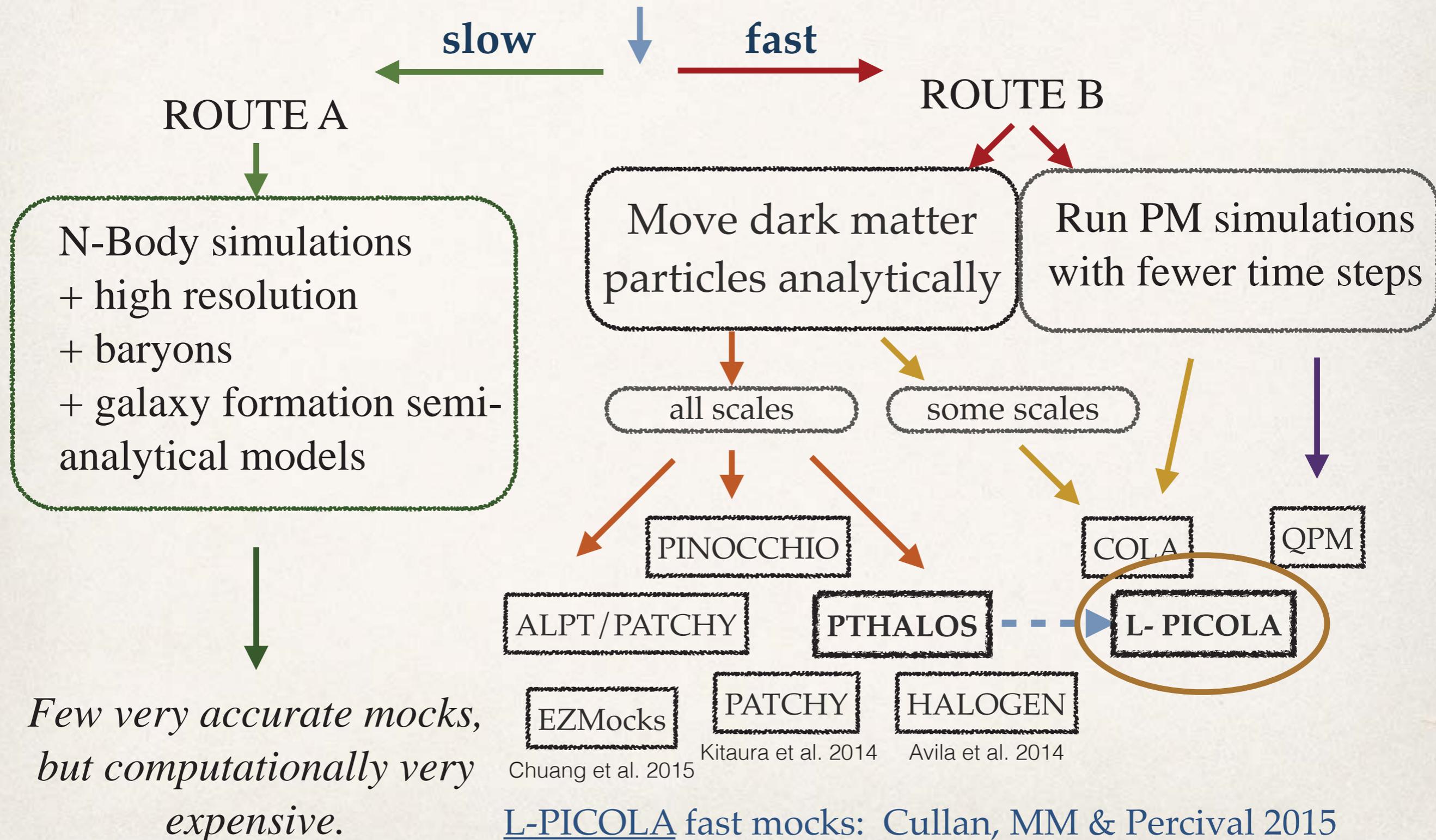
# Mock Catalogues



*Few very accurate mocks,  
but computationally very  
expensive.*

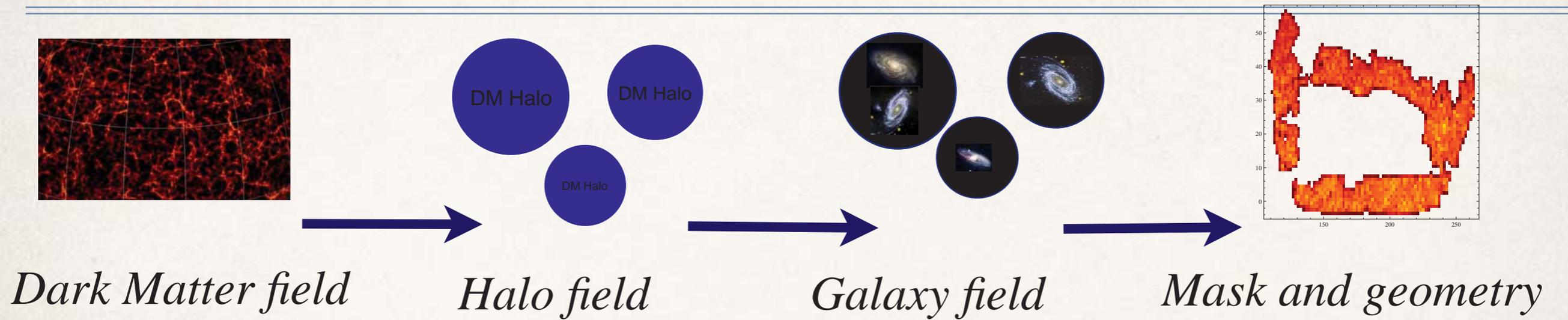
- ❖ *2-3 orders of magnitude faster than N-body runs*
- ❖ *decide how to define halos and populate galaxies*

# Mock Catalogues

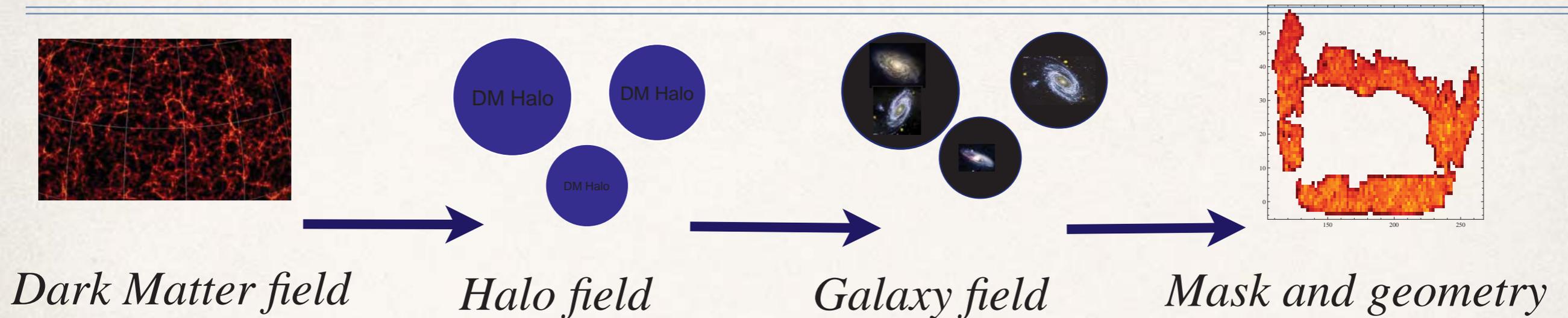


L-PICOLA fast mocks: Cullan, MM & Percival 2015  
 DES Fast Images on n-body: BCC & UFIS, Chang 2015

# Matter fields: 2LPT



# Matter fields: 2LPT

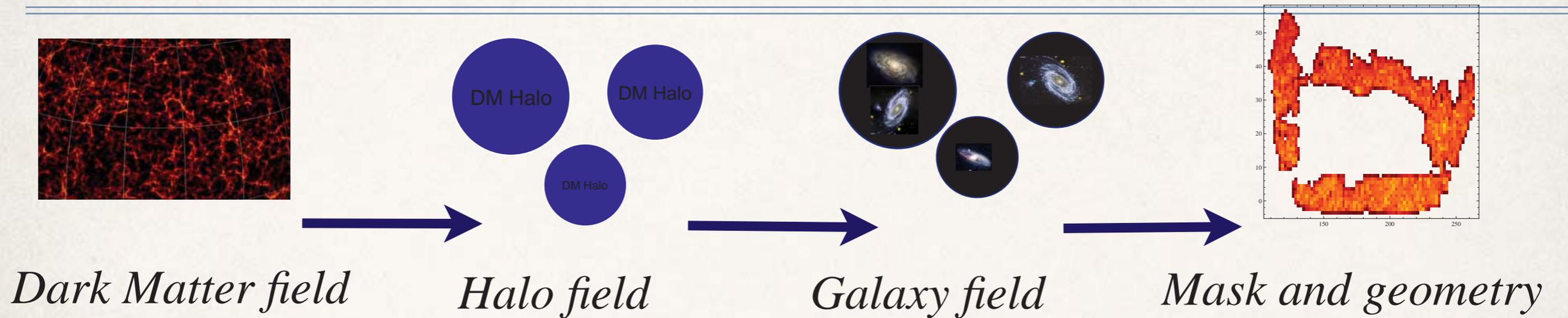


$$\vec{x}(\tau) = \vec{q} + \vec{\Psi}(\vec{q}, \tau) \quad \vec{\Psi} = \vec{\Psi}^{(1)} + \vec{\Psi}^{(2)} + \dots$$

$$\frac{d^2 \vec{x}}{d\tau^2} + \mathcal{H}(\tau) \frac{d\vec{x}}{d\tau} = -\nabla \phi \quad \text{Use the Poisson equation}$$

$$J(\vec{q}, \tau) \nabla \cdot \left[ \frac{d^2 \vec{x}}{d\tau^2} + \mathcal{H}(\tau) \frac{d\vec{x}}{d\tau} \right] = \frac{3}{2} \Omega_m \mathcal{H} (J(\vec{q}, \tau) - 1)$$

# Matter fields: 2LPT



$$\vec{x}(\vec{q}) = \vec{q} - D_1 \nabla_q \phi^{(1)} + D_2 f_2 \nabla_2 \phi^{(2)}$$

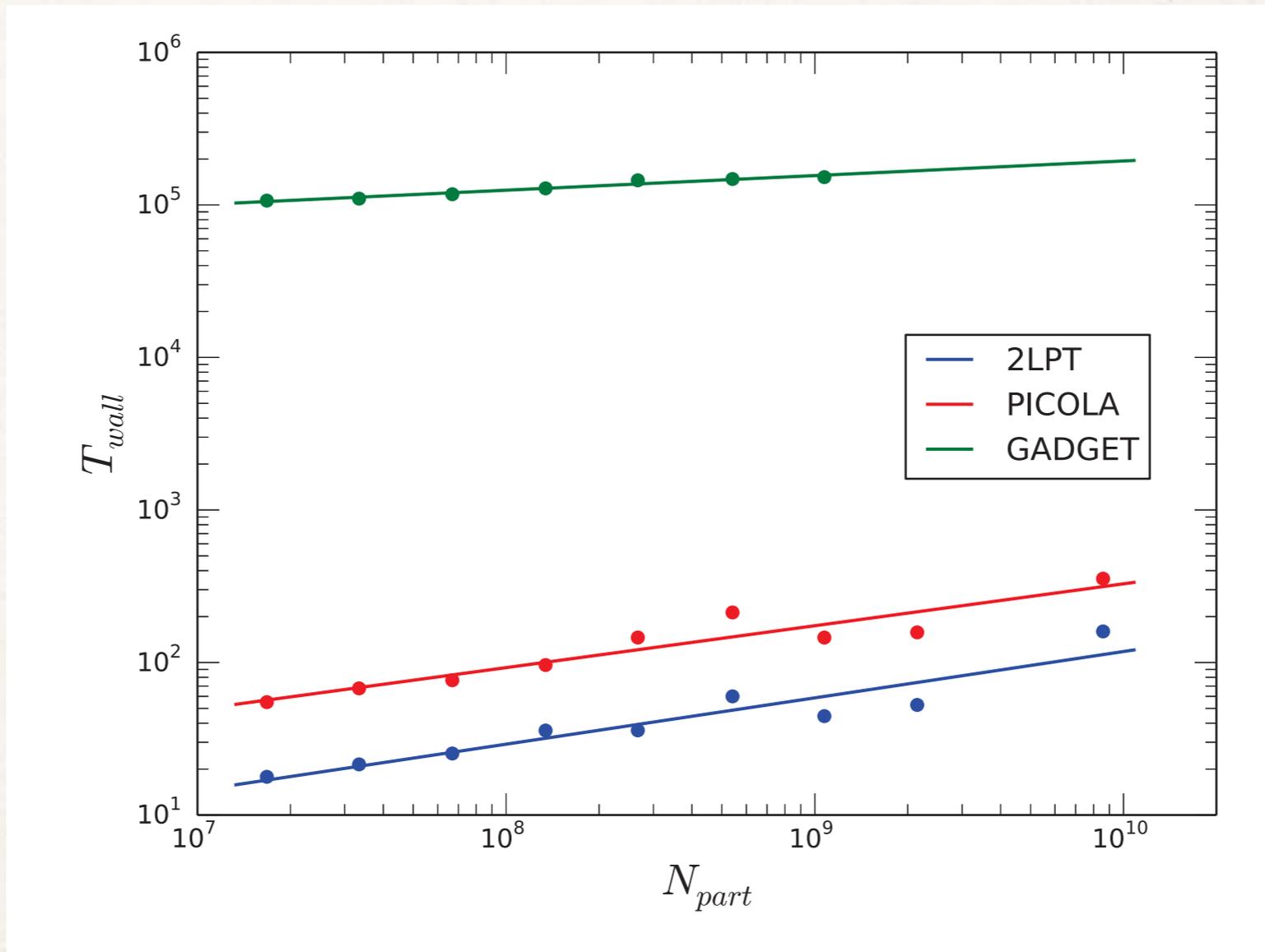
$$\vec{u}(\vec{q}) = -D_1 f_1 \mathcal{H} \nabla_q \phi^{(1)} + D_2 f_2 \mathcal{H} \nabla_2 \phi^{(2)}$$

*D and f are known, numerically and have very good analytical approximations.*

$$f_i \equiv (d \ln D_i) / (d \ln a)$$

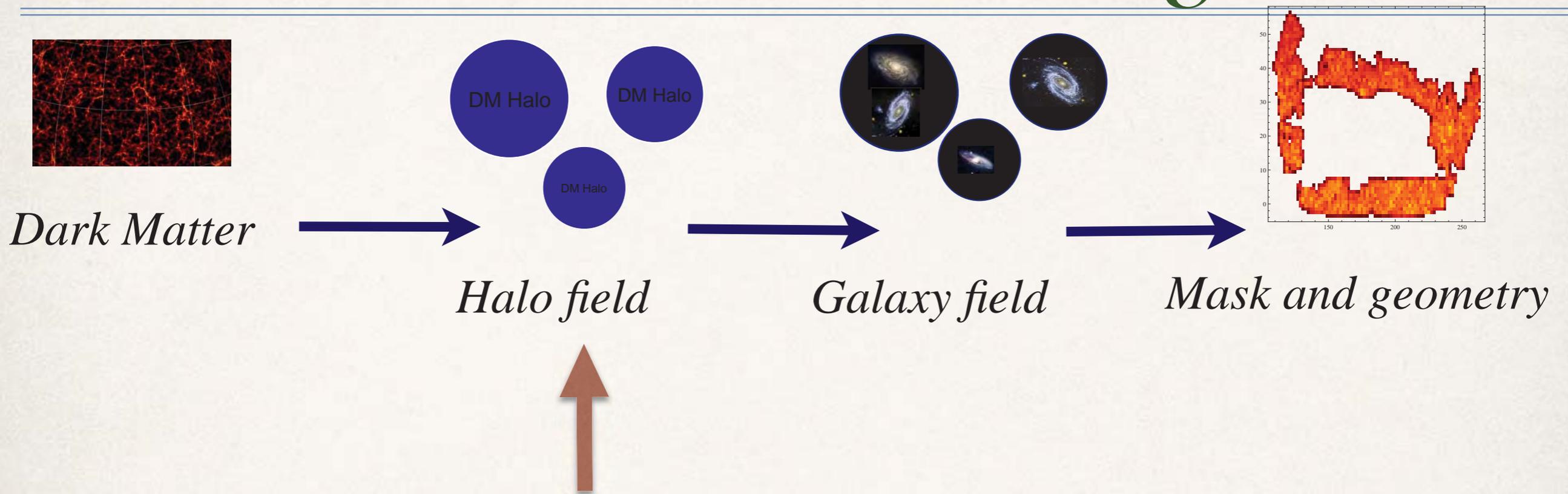
One can separate large scales (2LPT) and small scales (PM)  
COLA (Tassev et al. 2013), also implemented in L-PICOLA (Howlett, MM, Percival 2015).

# PICOLA performance



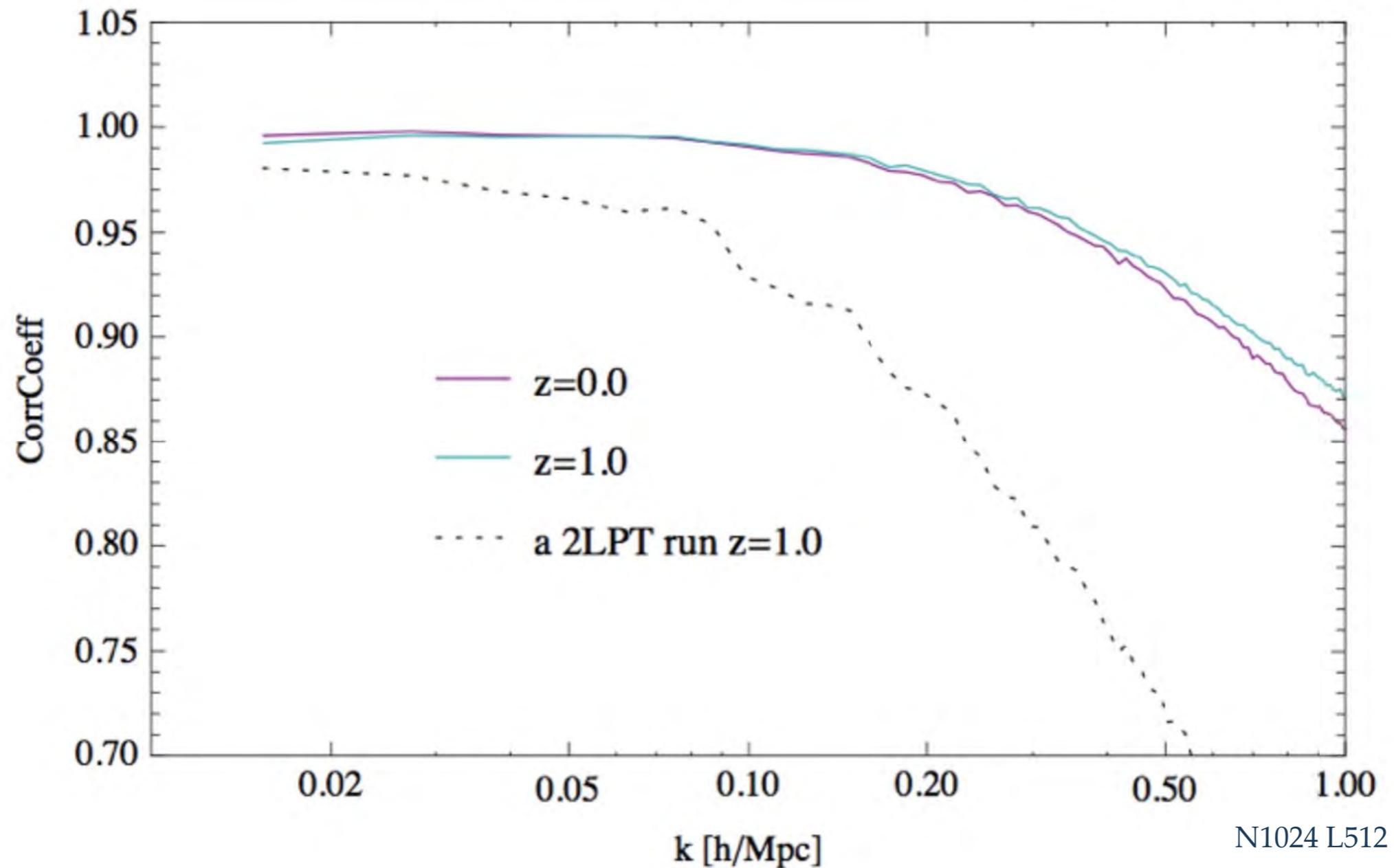
Howlett, MM, & Percival 2015

# L-PICOLA mock catalogues



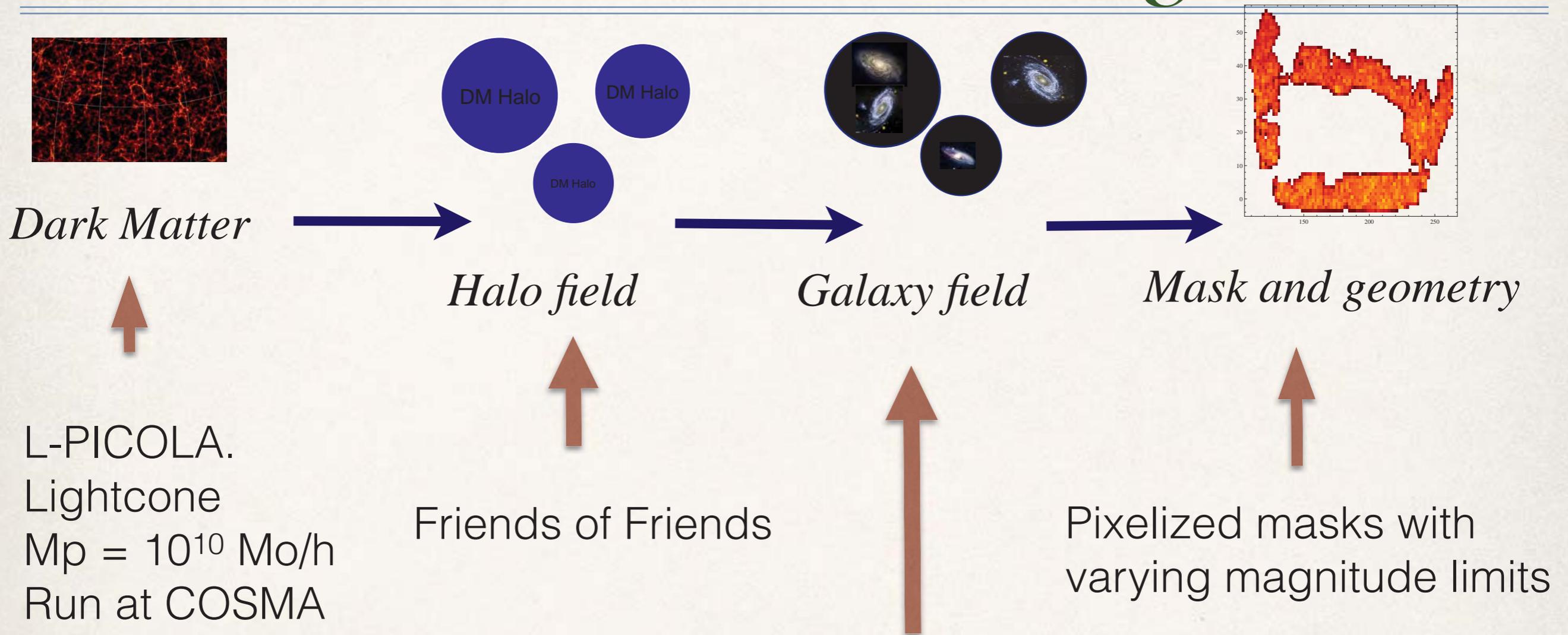
For DES mocks we use Friends-of-Friends.  
It is possible to use other schemes to place halos.

# L-PICOLA performance



$L=2048 \text{ Mpc}/h$   $N=4096$   
Flat LCDM  $\Omega_m=0.317$   $s_8=0.83$

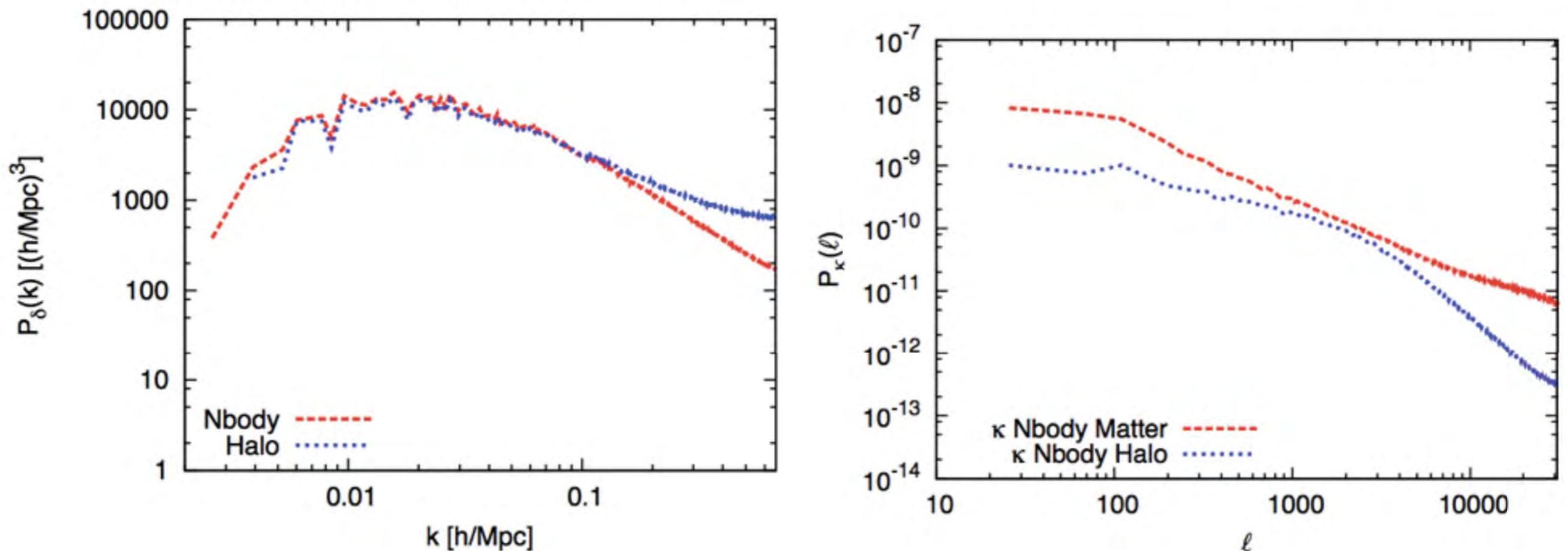
# L-PICOLA mock catalogues



**Mocks  
for DES**

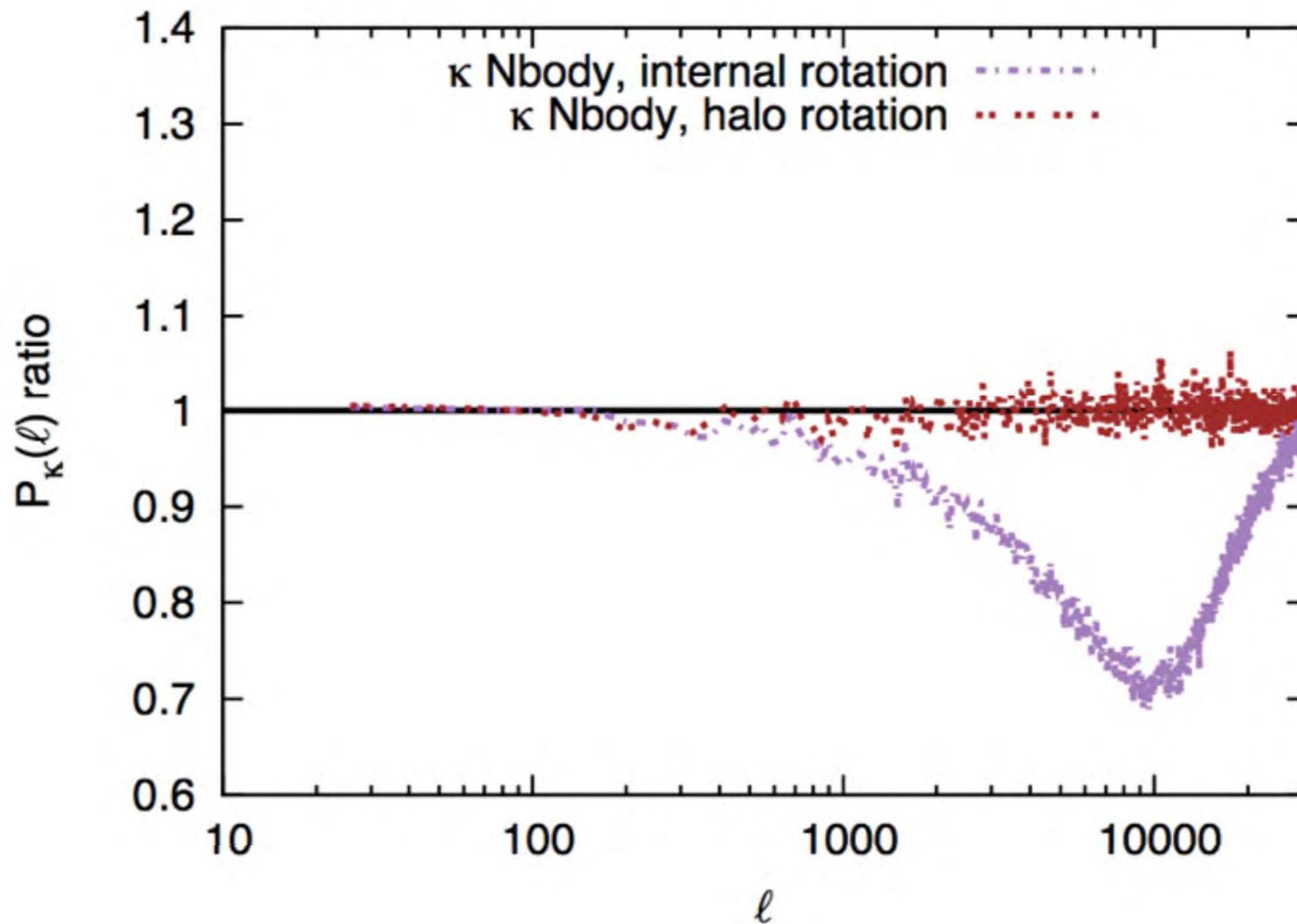
# Mock catalogues: cosmic web

The importance of cosmic web on the power spectrum



The cosmic web contributes significantly to the convergence power spectrum.  
Obtaining  $P_{\kappa}$  only from halos misses power.

# Mock catalogues: substructure





# Summary

- Initial Science Verification data already yielding high-quality results; photoz codes already comply with science requirements, and images are good for lensing.
- First results include: lensing of four massive clusters, mass maps, galaxy bias from different probes, discovery of 8 candidates for Milky Way dwarf galaxy satellites, superluminous supernova, etc: 50 papers from DES already out
- MUCH work ongoing within DES. Third year of observations just about to end! We already have a first taste of dark energy results and cosmology.
- Mock galaxy catalogues are essential for the analysis of galaxy clustering. Fast mocks can be done using L-PICOLA.



Thank you!

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