# Measuring BAO in Photometric Redshift Surveys

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**Iberian Cosmology Meeting 2011** 

E. Sánchez et al. MNRAS 411 (2011) 277 A. Carnero et al. MNRAS 2011, to be submitted M. Crocce et al, MNRAS 2011, to be submitted

#### **OUTLINE**

#### Introduction: BAO Measurements and Photometric Surveys

#### **A New Method to Measure BAO**

Standard Ruler Description of the Method Calibration on Theoretical Calculations

#### **Application to a Cosmological Simulation**

MICE simulation Photometric Redshift Correlation Functions Application of the Method Results: Forecasts for next surveys

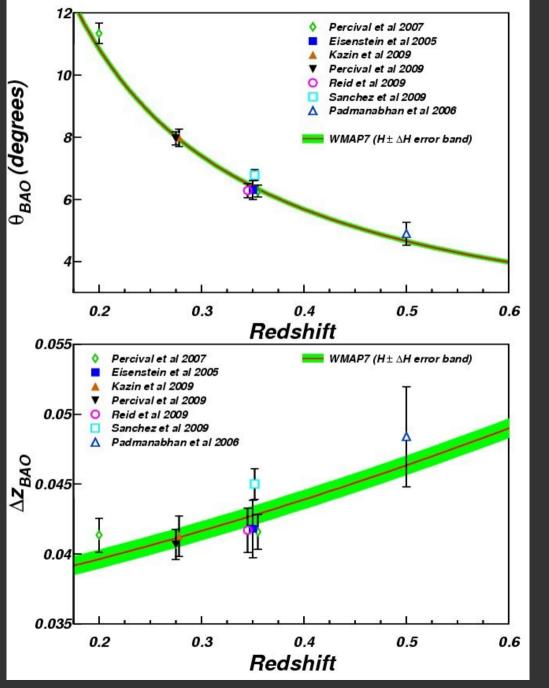
#### **Application to Real Data: SDSS**

Selection of the Galaxy Sample Photometric Redshifts Correlation Functions Results

#### **Conclusions**

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# **INTRODUCTION**



#### **CURRENT SITUATION**

Almost all the measurements of the BAO scale have been done using spectroscopic galaxy surveys (except that at z=0.5)

Use a combination of angular and transverse distances

#### NEW LARGE GALAXY SURVEYS ARE COMING Two ways for improvement: 1. More and <u>deeper spectra</u>

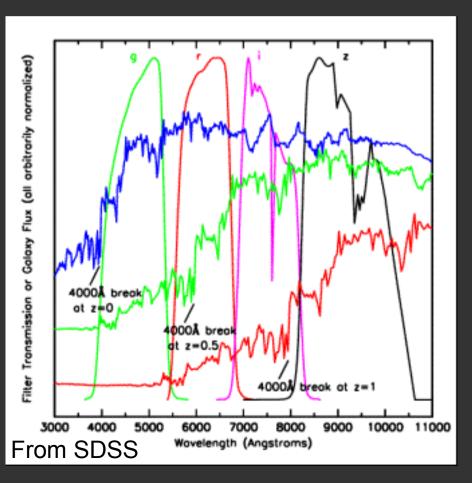
(spectroscopic)2. More volume and galaxies(photometric)

Sensitivity of photometric surveys beyond Fisher matrix: Systematic errors

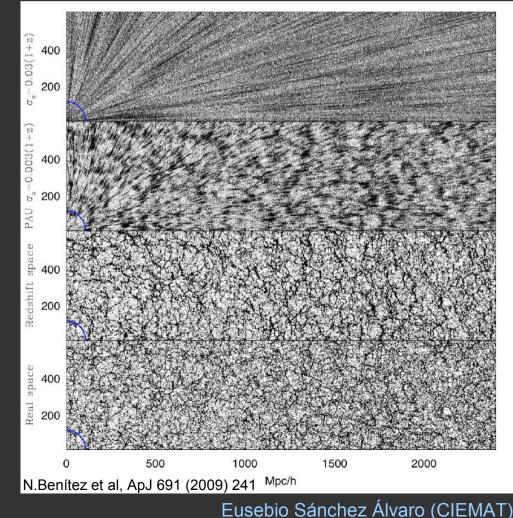
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### INTRODUCTION Large Galaxy Surveys

Spectroscopic BOSS (taking data) WiggleZ (finished) BigBOSS... Photometric DES (Starting october 2011) PanStarrs (taking data) PAU...



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### **NEW METHOD TO MEASURE BAO**

Try to optimize the power of upcoming photometric galaxy surveys, mainly to study the nature of the dark energy

Use only observable quantities, maintain the method model independent (no fiducial models)

Avoid any bias when constraining exotic cosmological models

Minimize the impact of systematic errors

Use BAO as a standard ruler. Do not try to fully describe the correlation function, but only localize the BAO scale with the maximum precision

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### **ANGULAR CLUSTERING**

Angular correlation function of galaxies: Excess joint probability that two galaxies are found in two solid angle elements with angular separation  $\theta$  compared to a homogeneous Poisson distribution.

#### **PROJECTION OF THE 3D FUNCTION**

$$\omega(\theta) = \int_0^\infty dz_1 \,\phi(z_1) \int_0^\infty dz_2 \,\phi(z_2) \,\xi(r;\bar{z})$$

$$\bar{z} = (z_1 + z_2)/2 \quad r = \sqrt{\chi(z_1)^2 + \chi(z_2)^2 - 2\chi(z_1)\chi(z_2)\cos\theta}$$
$$\xi(r; z) = \int_0^\infty \frac{dk}{2\pi^2} k^2 j_0(kr) P(k; z) \ \chi(z) = \frac{c}{H_0} \int_0^z \frac{dz}{\sqrt{\Omega_m(1+z)^3 + \Omega_\Lambda(1+z)^{3(1+w)}}}$$

#### No small angle approximation (Limber) PL(k) from CAMB.

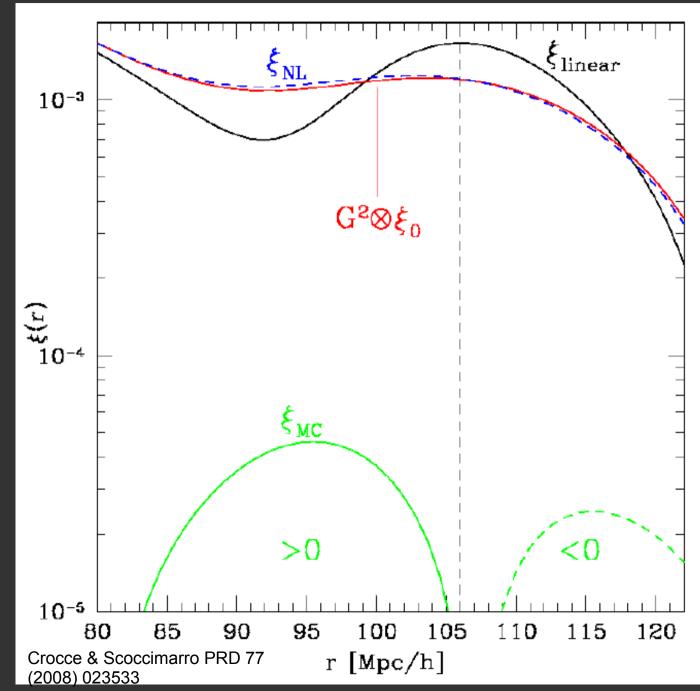
#### NON-LINEARITIES as Renormalized perturbation theory (no mode-mode coupling term)

$$P_L \rightarrow P_L \mathrm{e}^{-k^2 \sigma_v^2(z)/2}$$

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$$\sigma_v(z) = \left[\frac{1}{6\pi^2} \int_0^\infty dk P_L(k;z)\right]^{-1/2}$$

#### ANGULAR CLUSTERING



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## ANGULAR CLUSTERING

**COVARIANCE** (statistical error)

 $\operatorname{Cov}_{\theta\theta'} \equiv \langle \omega(\theta)\omega(\theta') \rangle$ 

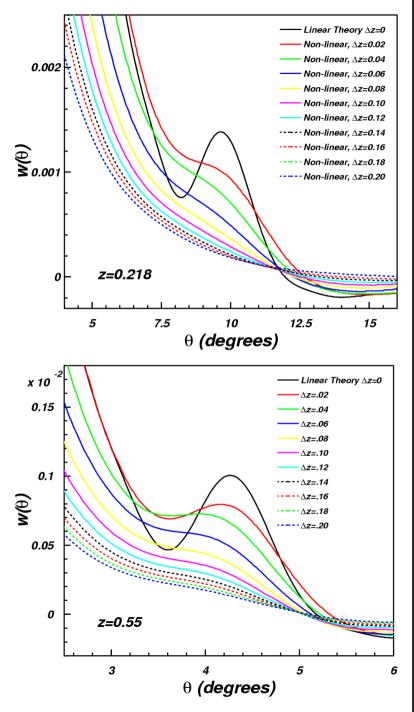
$$\operatorname{Cov}_{\theta\theta'} = \sum_{l \ge 0} \frac{2(2l+1)P_l(\cos(\theta))P_l(\cos(\theta'))}{(4\pi)^2 f_{\text{sky}}} \left[ C(l) + \frac{1}{N/\Delta\Omega} \right]^2$$

Where fsky is the fraction of the sky covered by the survey and N/ $\Delta\Omega$  is the galaxy density

### 2 main components

Poissonian component related to the number of galaxies (density) of the survey Cosmic variance, coming from the covered area

### PROJECTION EFFECT



The standard ruler method requires to relate the BAO scale with the position of the peak in the correlation function of galaxies

We have to distinguish  $\theta_{BAO} = r_{BAO}/\chi(z)$ ,  $\theta_{FIT}$  and the local maximum of w( $\theta$ ). These three values are DIFFERENT

We propose a method to obtain  $\theta_{BAO}$  from  $\theta_{FIT}$ , correcting for observational effects in model independent way

The main correction arises from the projection effect due to the redshift bin width, which has two effects on the correlation function: Makes the amplitude lower and moves the local maximum to smaller values

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## **NEW METHOD TO MEASURE BAO**

- 1. Divide the full sample in redshift bins.
- 2. Compute the angular two-point correlation function in each redshift bin.
- 3. Parametrize the correlation function using the expression:

$$\omega(\theta) = A + B\theta^{\gamma} + Ce^{-(\theta - \theta_{FIT})^2/2\sigma^2}$$

and perform a fit to  $\omega(\theta)$  with free parameters A,B,C, $\gamma$ ,  $\theta_{FIT}$ ,  $\sigma$ .

- 4. The BAO scale is estimated using the parameter  $\theta_{FIT}$  and correcting it for the projection effect:  $\theta_{BAO}(z) = \alpha(z, \Delta z)\theta_{FIT}(z)$
- 5. Fit cosmological parameters to the evolution of the corrected  $\theta_{BAO}$  with z.

#### <u>CALIBRATION OF THE METHOD</u>

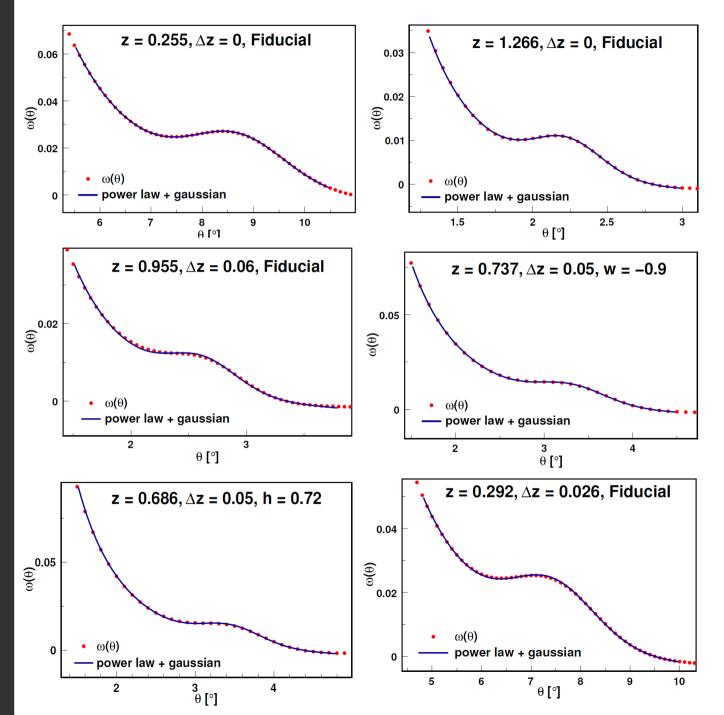
We have tested the goodness of the parametrization in a redshift range that goes from z=0.2 to z=1.4, for a wide range of bin widths and for 14 cosmological models

The fits to the proposed parametrization have always  $0.98 < \chi^2 < 1.01$ with probabilities in the range 0.6 to 0.9, even when the error in each point of w( $\theta$ ) is 1%, much smaller than any real survey!

h	$\Omega_M$	$\Omega_b$	$\Omega_k$	$w_0$	$w_{a}$	$n_s$
0.70	0.25	0.044	0.00	-1.00	0.0	0.95
0.68						
0.72						
	0.20					
	0.30					
		0.040				
		0.048				
			+0.01			
			-0.01			
				-0.90		
				-1.10		
					-0.1	
					+0.1	
251						1.00

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#### <u>CALIBRATION OF THE METHOD</u>



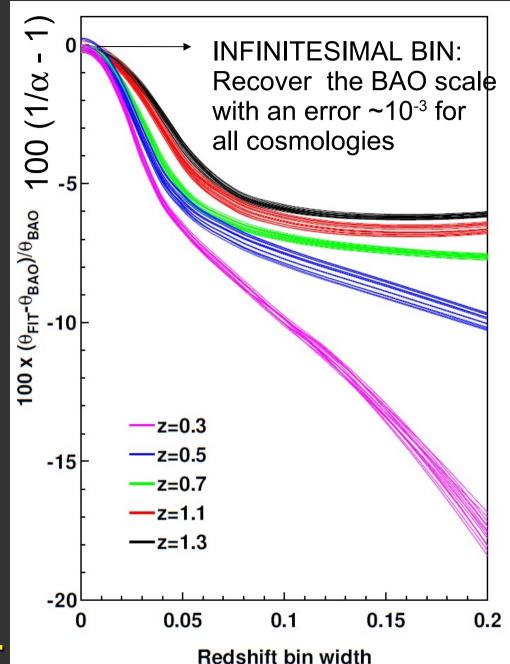
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## **CALIBRATION: Projection effects**

- 1. Applying parametrization to all 770  $\omega(\theta)$ :
- 2. We can correct  $\theta_{FIT}$  to obtain  $\theta_{BAO}$  independent of cosmology.
- In each band there are 14 cosmological models. Half width of band is the error in the correction.
- 4. Observe this is relative offset. In absolute,  $\theta_{BAO}$  is different for each model.

#### <u>CORRECTION IS</u> COSMOLOGY INDEPENDENT



#### **MICE Simulation**

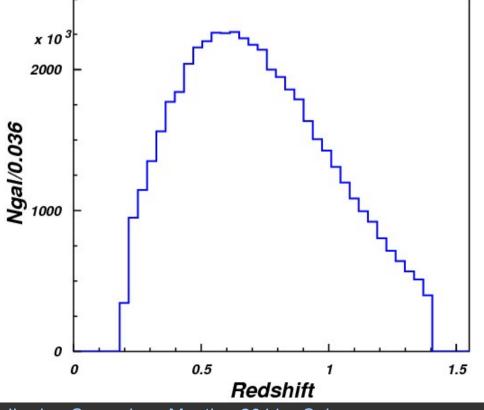
### One of the largest cosmological simulations ever done. http://www.ice.cat/mice/



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## **SIMULATION: Dark Energy Survey (DES)**

DES Simulation Challenge Publicly available Same volume than expected in DES 5000 sq-deg and 50 million galaxies (dark matter particles)

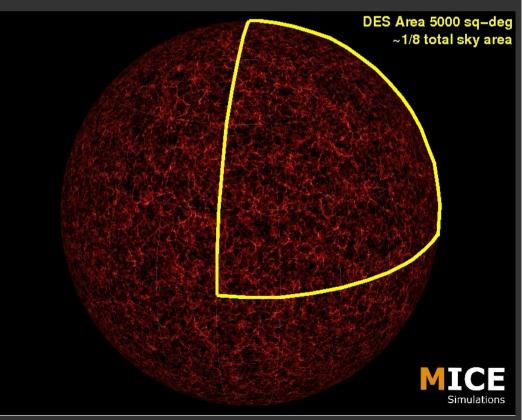


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### FIDUCIAL COSMOLOGY

#### MICE Simulation Common Parameters

Baryon density,  $\Omega_b = 0.044$ Matter density,  $\Omega_m = 0.25$ Dark-energy density,  $\Omega_\Lambda = 0.75$ Scalar spectral index,  $n_s = 0.95$ Rms matter fluctuation amplitude,  $\sigma_8 = 0.8$ Hubble paramter (in units of 100 km/sec/Mpc), h = 0.7

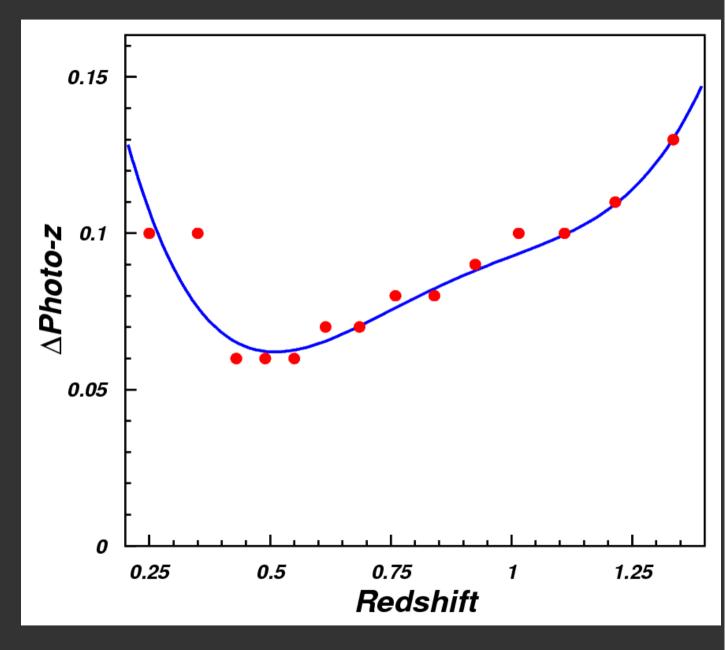


### **SIMULATION: Photoz in DES**

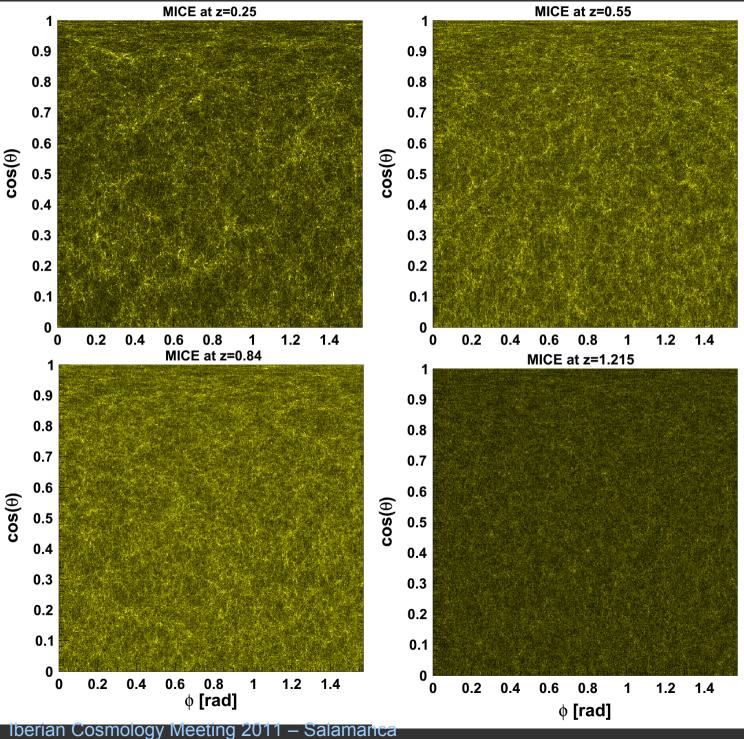
We include the photoz in the simulation smearing the redshift of each galaxy with a gaussian of width  $\Delta$ photoz

#### All results include the photoz

We use 14 bins of redshift which follow the photoz error distribution



#### **SIMULATION: Galaxy density Maps**



 $\phi$ =ra,  $\theta$ =90°-dec

We build a map for each redshift bin

636x636 pixels (equivalent to healpix Nside=512,  $\Delta\theta \sim 0.1^{\circ}$ )

All pixels have the same area

### **SIMULATION: Photoz resolution and correlations**

The resolution in the measurement of photoz produces galaxy migration between bins

The correlation matrix between bins is directly related to the migration matrix

We calculate and use the covariance matrix, including correlated and uncorrelated errors in the measurement of the BAO scale

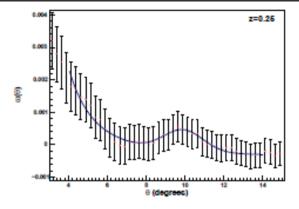
$$C_{ij} = \langle w_i^{O}(\theta) w_j^{O}(\theta') \rangle = \sum_{k=1}^{N_{bins}} (r_{ik}^2 r_{jk}^2) \frac{(N_k^T)^4}{(N_i^O)^2 (N_j^O)^2} Cov_{\theta\theta'}$$

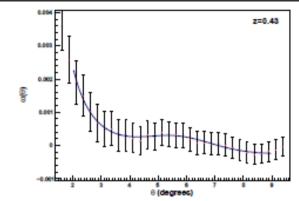
Where  $r_{ij}$  are the mixing matrix elements,  $N_i^T$  are the number of galaxies with true-z in bin *i* and  $N_i^O$  are the number of galaxies with photo-z in bin *i*.

400 350 300 250 200 150 100 50 <sup>0</sup>0.2 Redshift 0.8 Bin Number j 0.6 0.45 0.2 10 Bin Number i

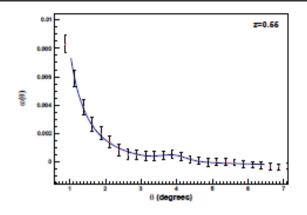
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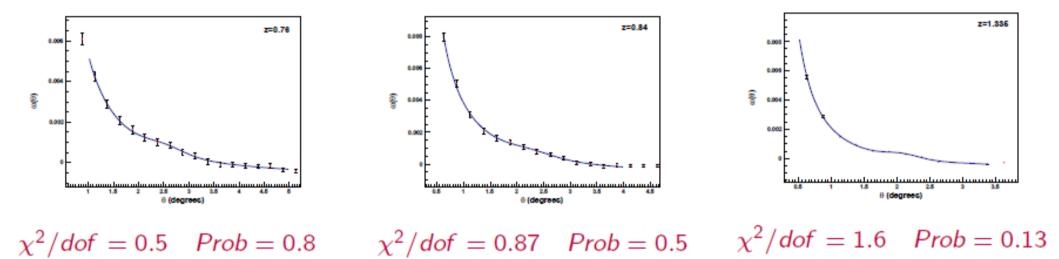
#### **LATION: Angular correlation functions**





 $\chi^2/dof = 0.1$  Prob = 1  $\chi^2/dof = 0.15$  Prob = 1  $\chi^2/dof = 0.4$  Prob = 0.97





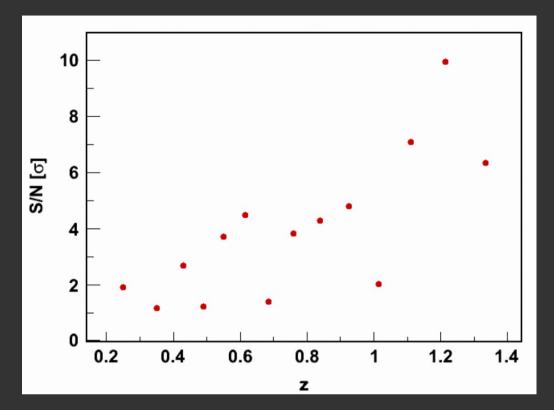
Compute w(q) using the Landy-Szalay estimator Statistical error from C matrix, including correlation between redshift bins In each bin we apply the fit to the parametrization arounf the BAO peak The correction is applied using the true redshift bin width, taking into account the photoz resolution

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#### Significance & Systematic Errors

Statistical significance of the peak detection grows with the redshift

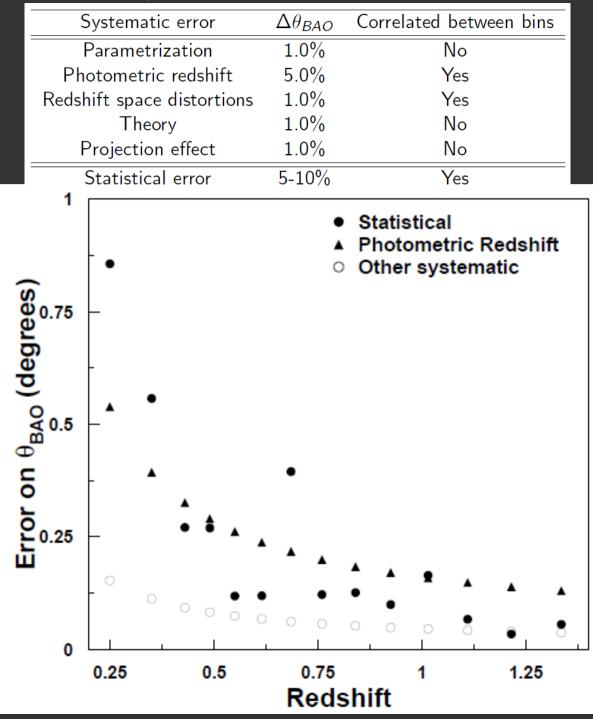
Mainly limited by the area of the survey and the photoz resolution



#### **SYSTEMATIC ERRORS** Photoz Redshift Space distortions Parametrization Non-linearities Correction of the projection effect

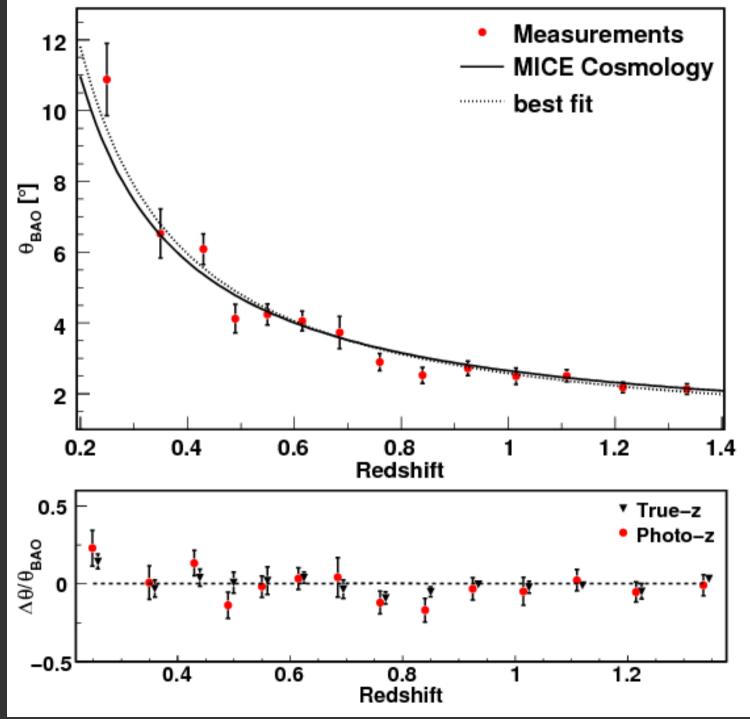
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#### **Systematic Errors**



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### <u>RESULTS</u>



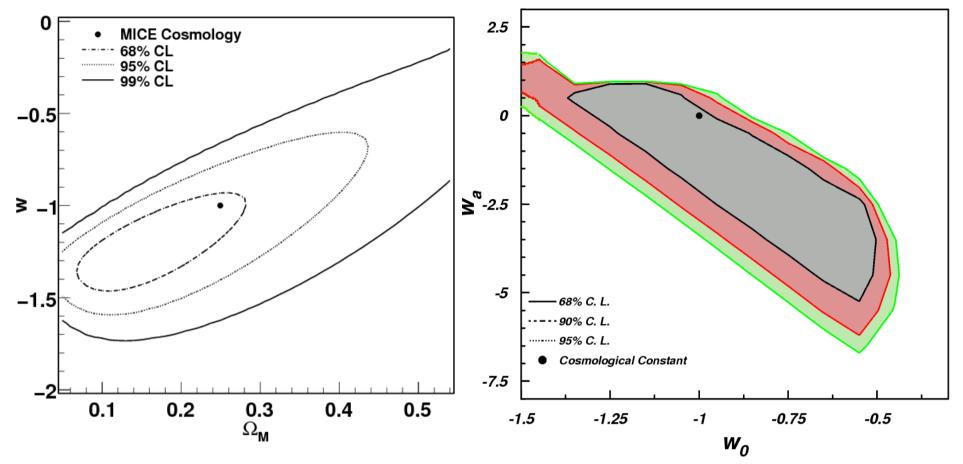
Results in good agreement with the cosmology of the simulation

Also shown the results obtained using the true z

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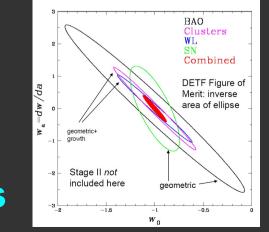
#### **RESULTS**



#### <u>Other parameters fixed to their true</u> <u>values. Cosmology is recovered.</u>

#### Include correlations between bins In good agreement with DES expectations

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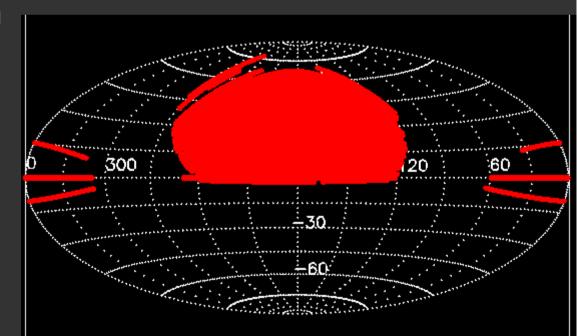
# <u>REAL DATA : SDSS</u>

The Sloan Digital Sky Survey (SDSS) has been operating since 2000.

- Dedicated 2.5m telescope at Apache Point (New Mexico)
- 120 Mpx camera (1.5 sq-deg) and 2 spectrographs (640 fibers)
- -Final data set (DR7): 230 million objects in 8400 sq-deg and spectra for 930000 galaxies, 120000 quasars and 225000 stars
- Currently in phase SDSS-III (one of the main projects is BOSS, dedicated to dark energy with BAO)

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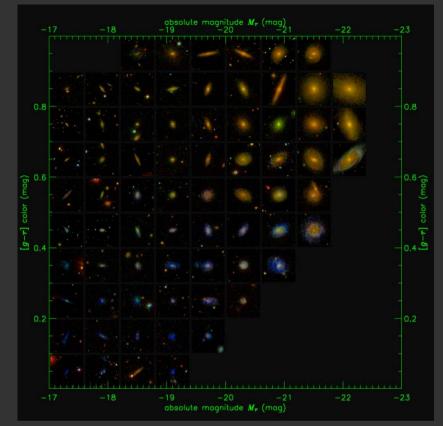
## <u>REAL DATA : SELECTION OF THE SAMPLE</u>

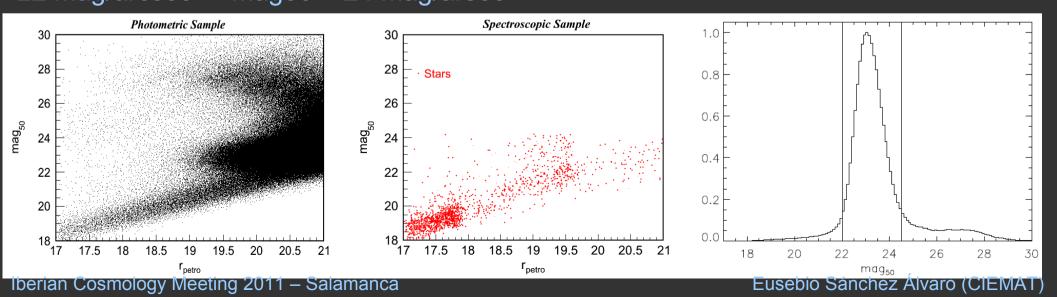
Homogeneous and bright sample: LRG Use the SDSS-II legacy catalogue DR7

#### Color based selection

1) Region of color-color space populated by LRGs (r-i) > (g-r)/4 + 0.36 (g-r)>-0.72 (r-i) + 1.7

2) Minimise star contamination 17 < petror < 21 0 < err\_petror < 0.5 0 < r-i < 2 0 < g-r < 3 22 mag/arcsec<sup>2</sup> < mag50 < 24 mag/arsec<sup>2</sup>

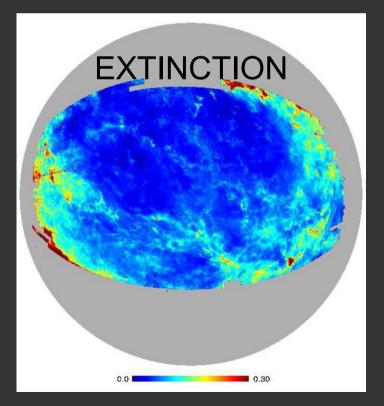


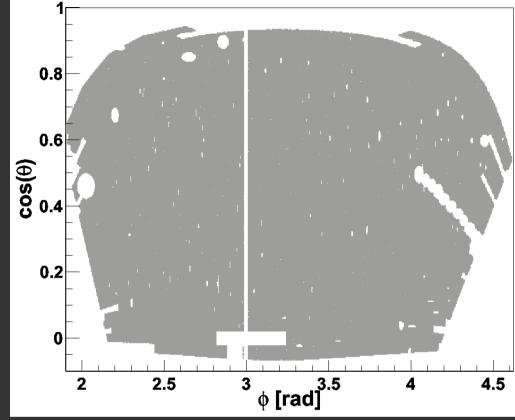


## REAL DATA : SELECTION OF THE SAMPLE

# <u>Mask out:</u>

Areas of no observation Areas with bad photometry Bright stars Bad photo

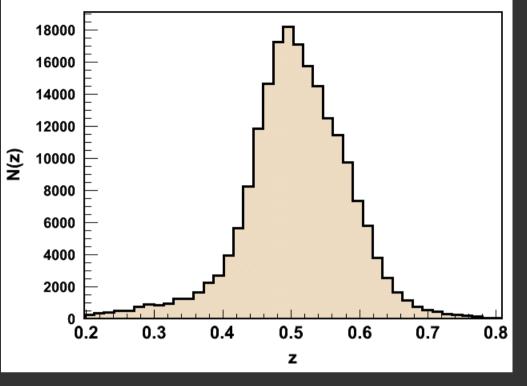




# Total analysed area 7136 sq-deg

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### <u>REAL DATA : PHOTOMETRIC REDSHIFT</u>



Photoz from the value added catalogue of the Chicago Group (Cunha et al. 2009, Lima et al. 2008)

Gives accurate estimates of the probability distribution p(z) for each galaxy

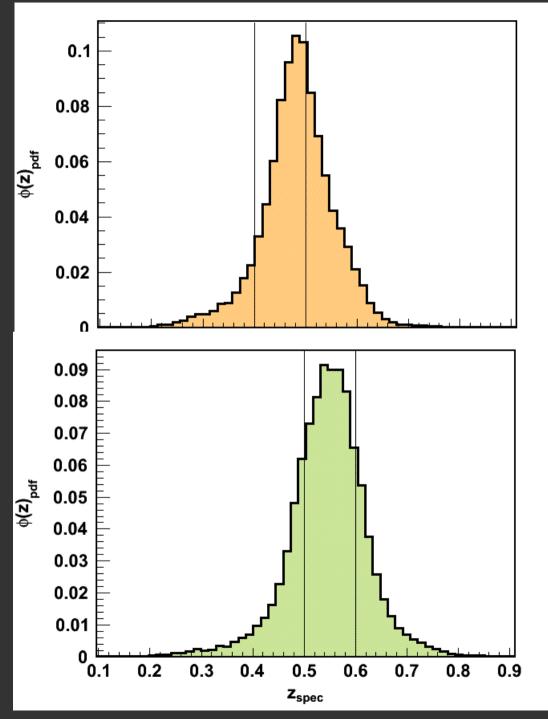
We estimate the redshift as the maximum of p(z) and compute N(z) using the full distribution p(z)

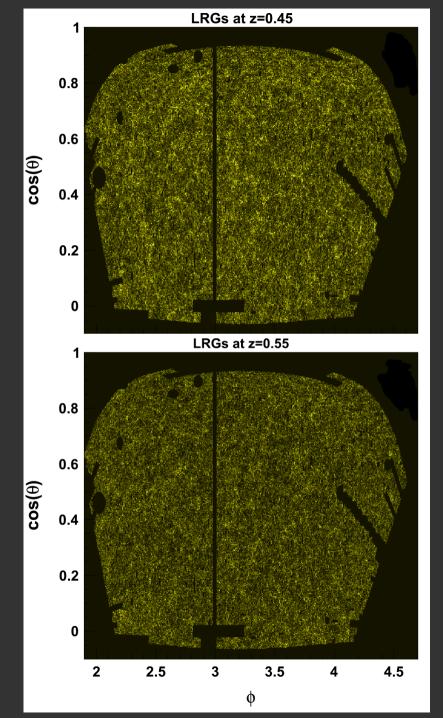
#### LRGs concentrate in 0.4 < z < 0.6Use 2 bins, centred at 0.45, 0.55 and of width 0.1

Much narrower bins do not enhance the sensitivity, due to the dilution effect of the photoz. Much wider bins make the amplitude of the correlation functin too small to detect the BAO signal due to the projection effect

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#### <u> REAL DATA : PHOTOMETRIC REDSHIFT</u>

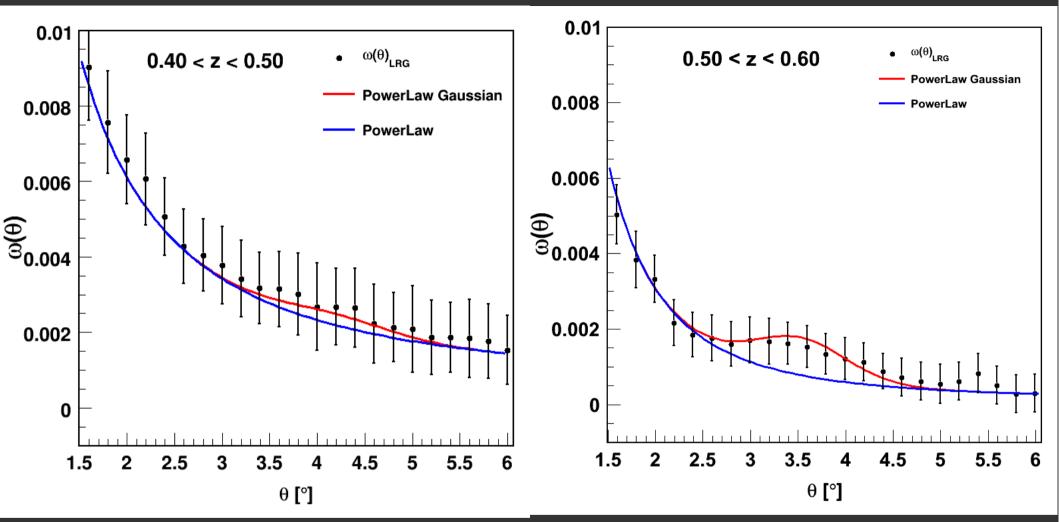




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#### **CORRELATION FUNCTIONS & FITS**

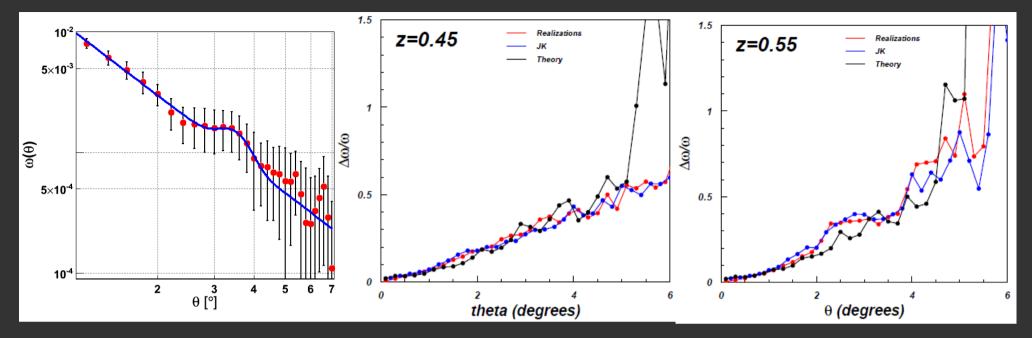


#### NO DETECTION Bad quality of the photoz

### DETECTED SIGNAL Significance = $2.6 \sigma$

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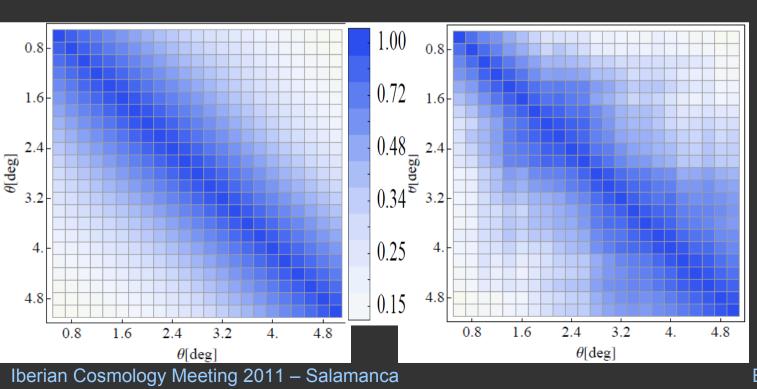
## **STATISTICAL ERROR WELL UNDER CONTROL**



3 different methods of estimating the error perfectly agree

Theory, Jack knife, artificial realizations

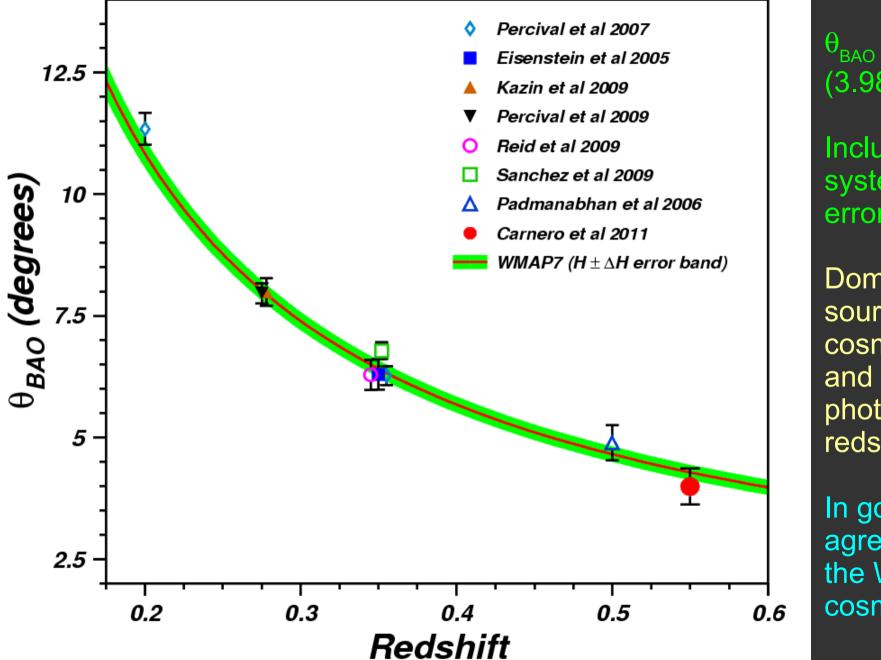
#### Not only the errors, but the full covariance matrix



## **SYSTEMATIC ERRORS**

Systematic Error	$\Delta  heta_{BAO}$	
Parametrization	1%	
Photoz	5%	
Redshift Space Distortions	1%	
Theory (nion-linearities)	1%	
Projection Effect	1%	
Photoz non-gaussianity	2%	
Selection	2.5%	
Mask	2%	

### <u>RESULTS</u>



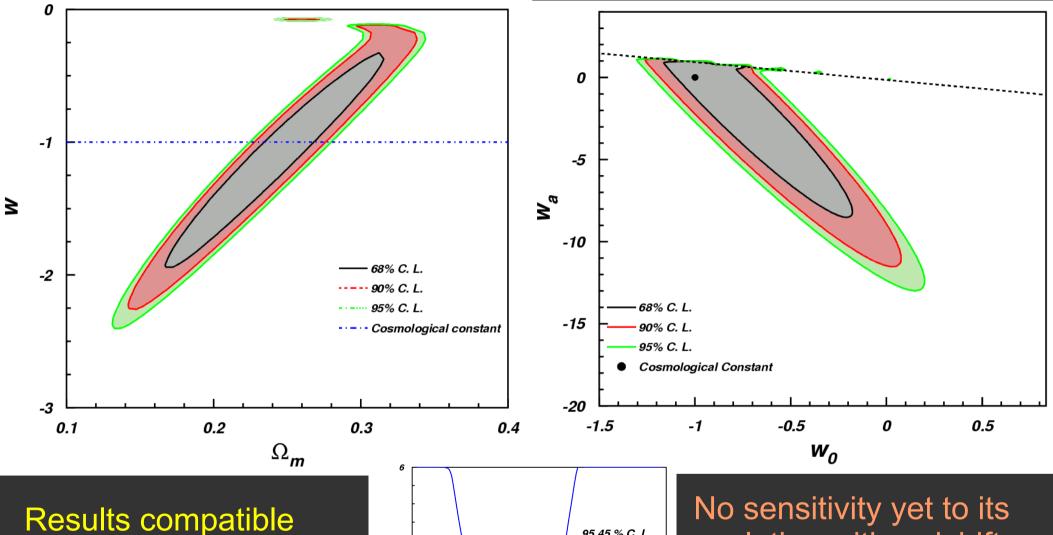
 $\theta_{BAO} (z=0.55) = (3.98 \pm 0.40)^{\circ}$ 

Including systematic errors

Dominant error sources are the cosmic varance and the photometric redshift

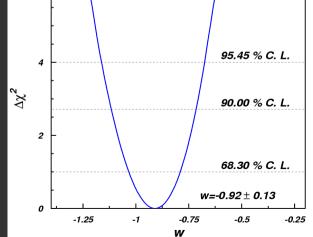
In good agreement with the WMAP7 cosmology

#### RES



with dark energy being a cosmological constant (~20% precision)

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# evolution with redshift

#### Deeper surveys needed

### **CONCLUSIONS**

We have developed a new method to measure with precision the BAO scale in photometric (also spectroscopic) survey, working only with observable quantities

#### It has been intensively tested and calibrated on different cosmological models, recovering the BAO scale with precision better than 1% in a model independent way

The method has been applied to a N-body simulation with the DES survey features, including the main systematic effects. The BAO scale is recovered within the scientific requirements of the survey (including the systematic errors)

#### Finally the method has been applied to the LRG DR7 sample of the SDSS survey.

We have measured the BAO scale to the highest redshift to date z=0.55 in a real photometric survey, demostrating the feasibility and sensitivity of the method

# The result is compatible with dark energy being a cosmological constant to a 20% precision, but current BAO data are not sensitive yet to the variation with redshift.

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