

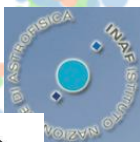


# Cosmology from galaxy clustering: the VIPERS perspective

Luigi Guzzo

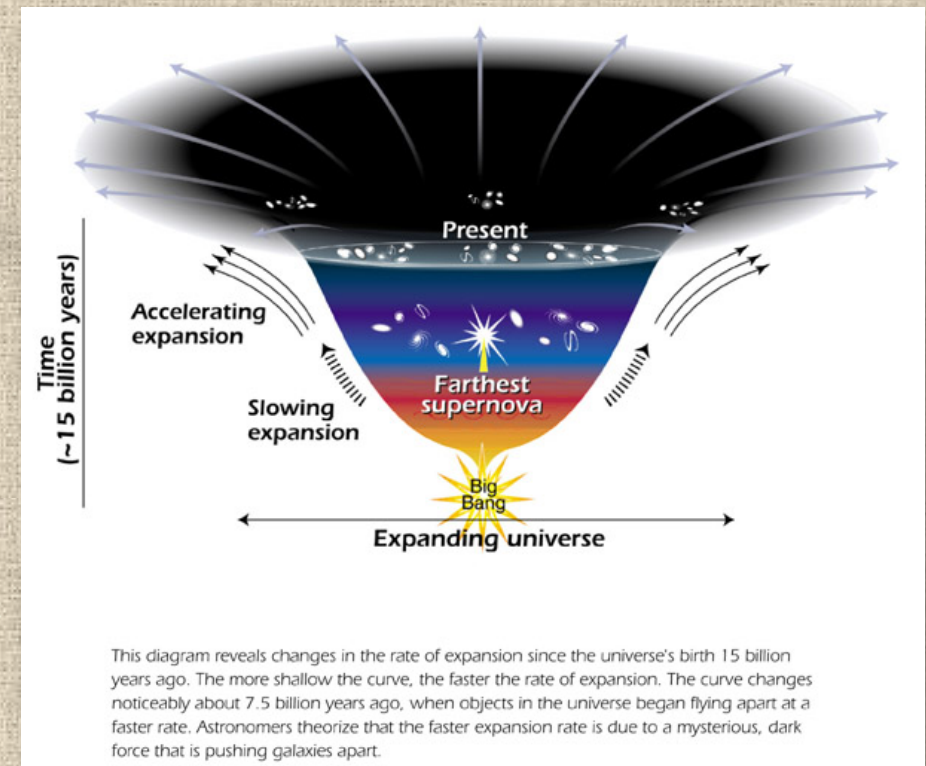
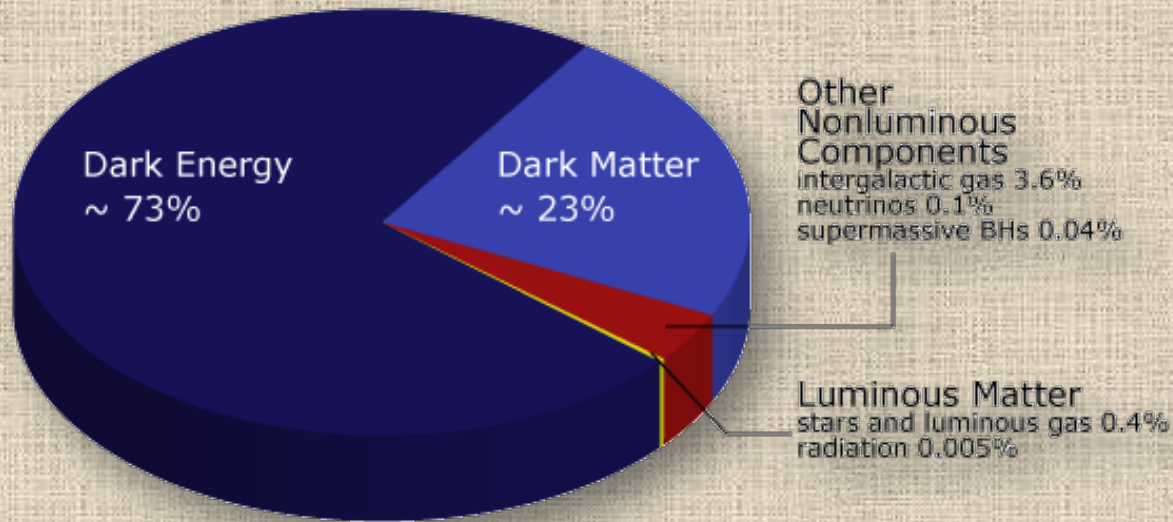
Dipartimento di Fisica - Università Statale di Milano

& National Institute of Astrophysics (INAF)



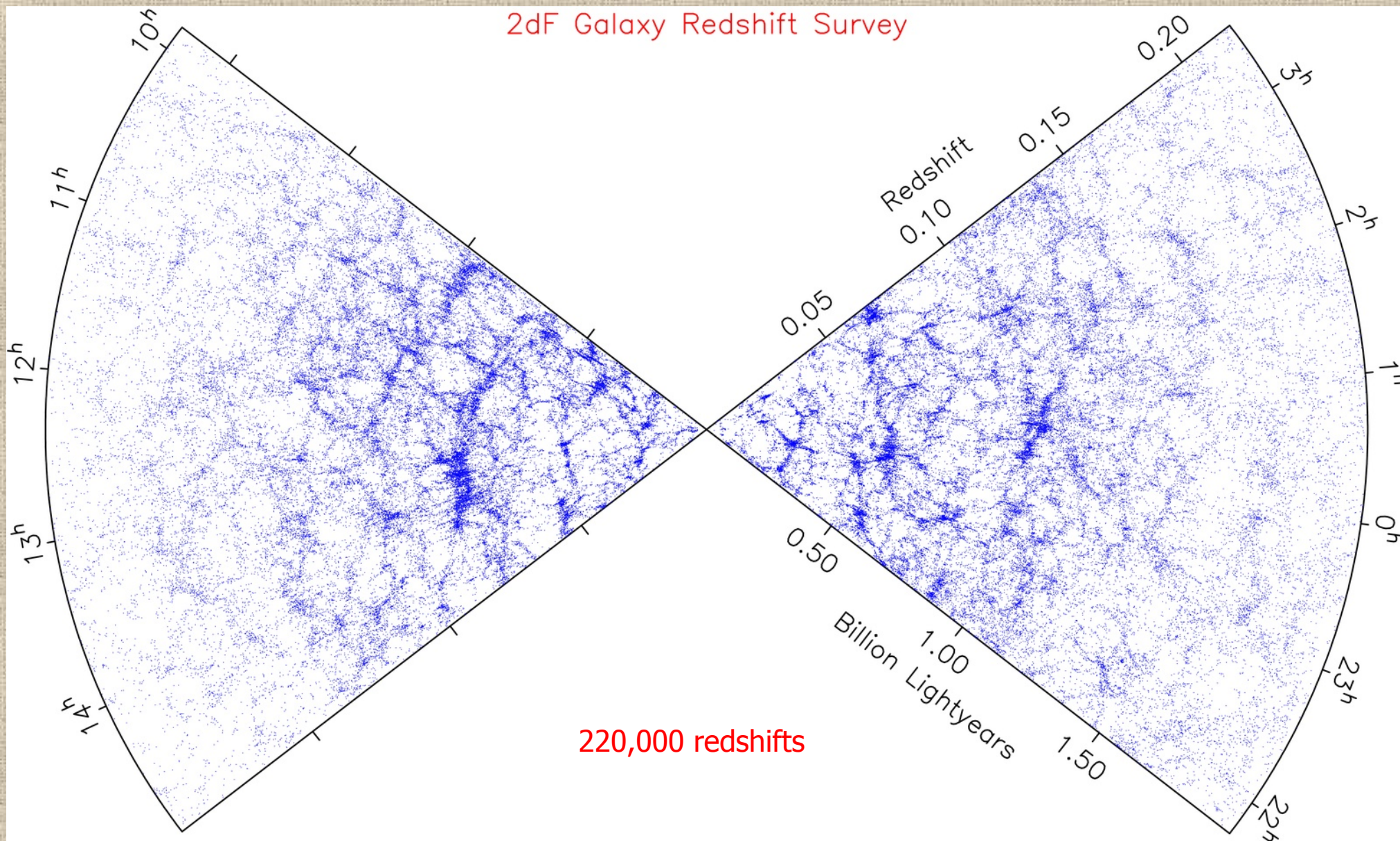
Work presented here has received funding from the European Union's Seventh Framework Programme for research, technological development and demonstration, under grant agreement no 291521

# The "cosmic pizza" of the 21<sup>st</sup> century: but who ordered it?



2011 Nobel Prize

# Large-scale structure at $z < 0.2$



# Galaxy redshift surveys: a major pillar of the cosmological model...

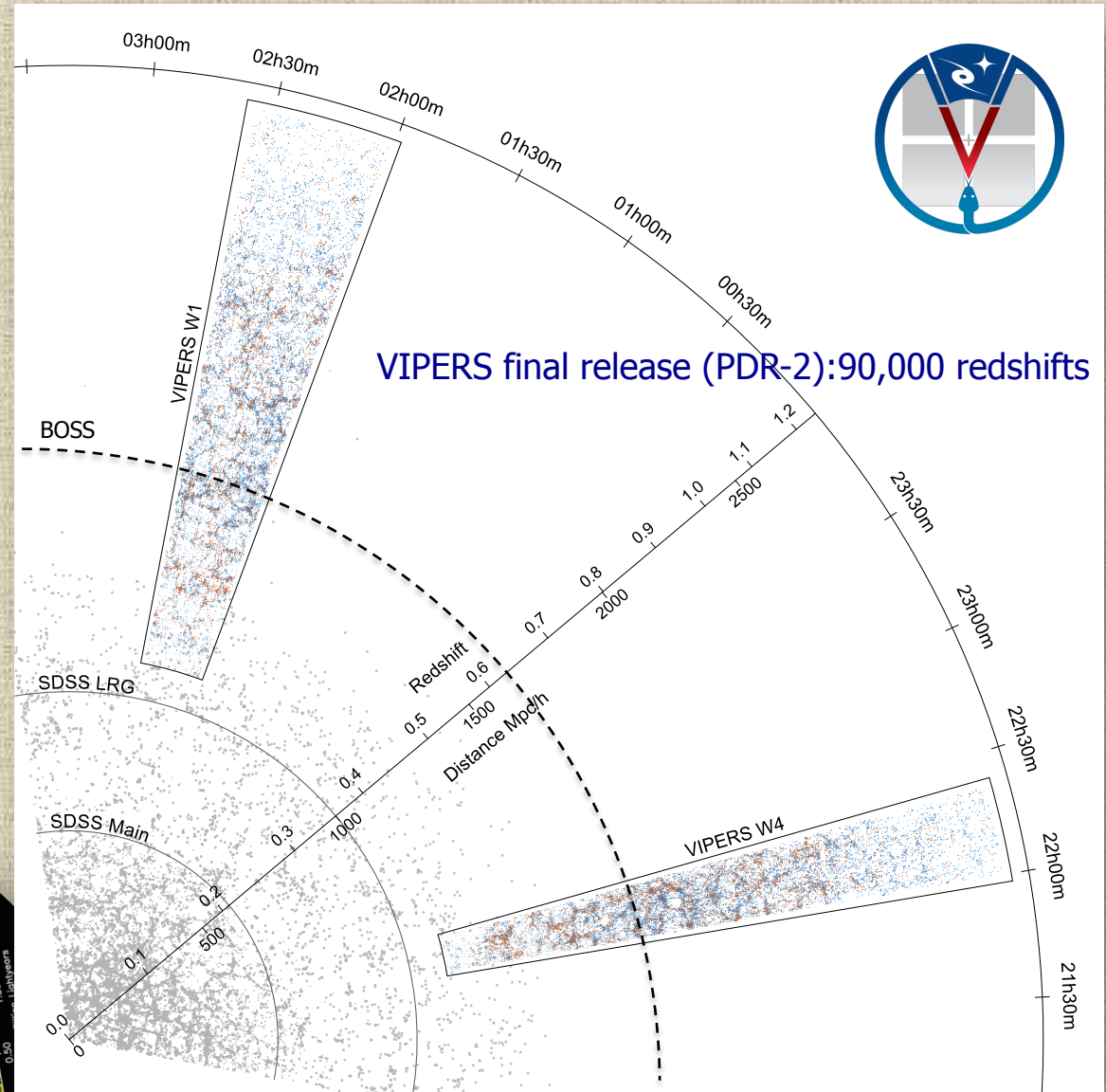
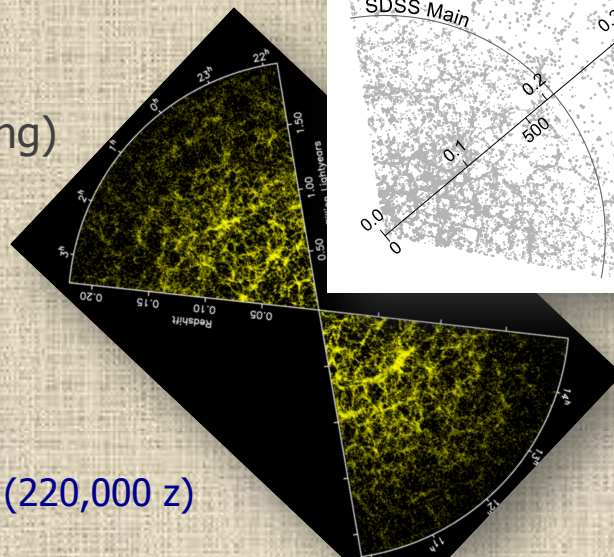
## State of the art:

- SDSS-III BOSS (e.g. Alam+ 2016)
- WiggleZ (Blake+ 2014)
- **VIPERS** (Guzzo+2014, Scodeggio+ 2017)

## Future:

- SDSS-IV eBOSS (ongoing)
- DESI (2019-)
- **Euclid** (2020-)

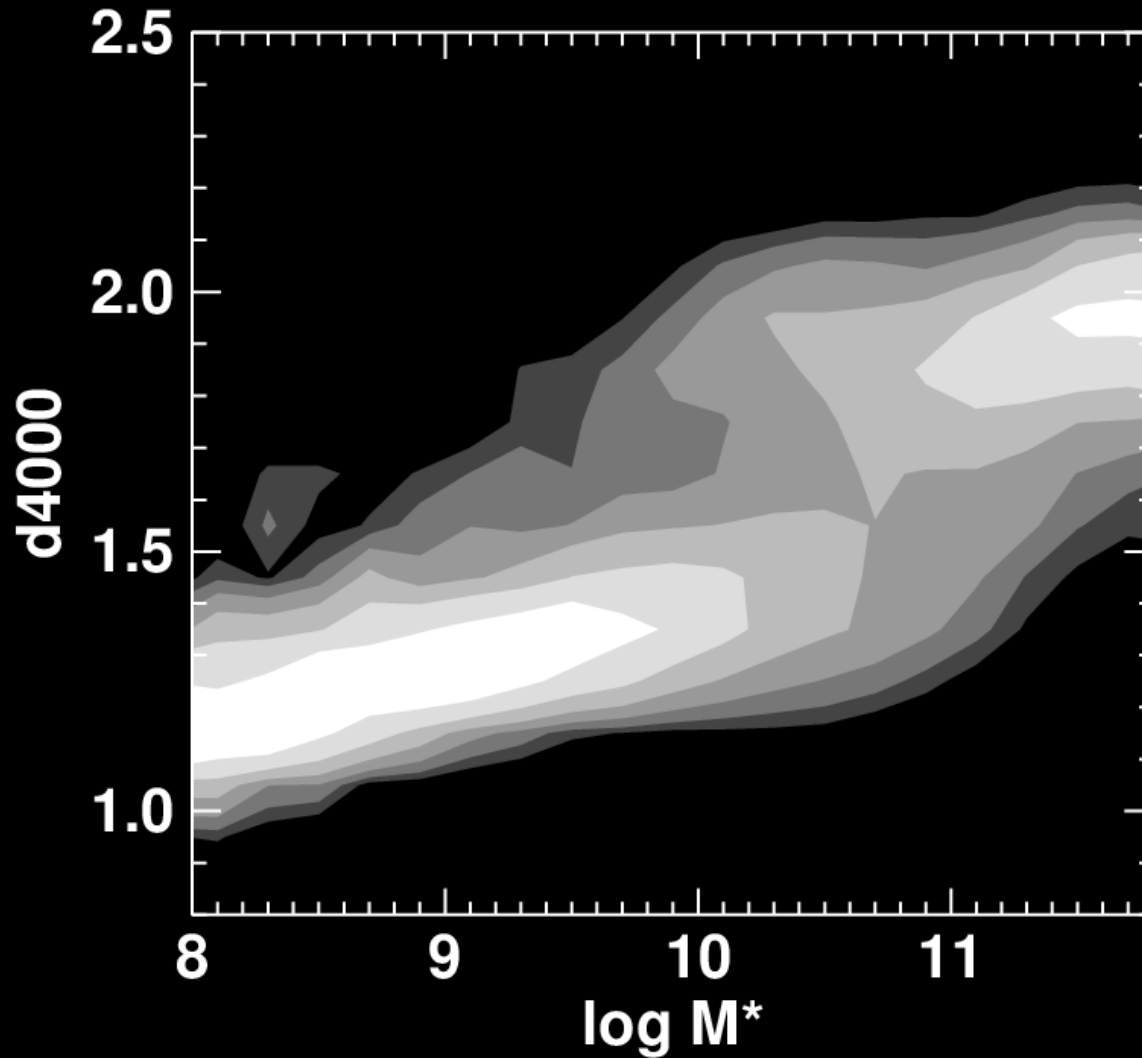
2dFGRS (220,000 z)



VIPERS final release (PDR-2): 90,000 redshifts

(arXiv 1611.07048)

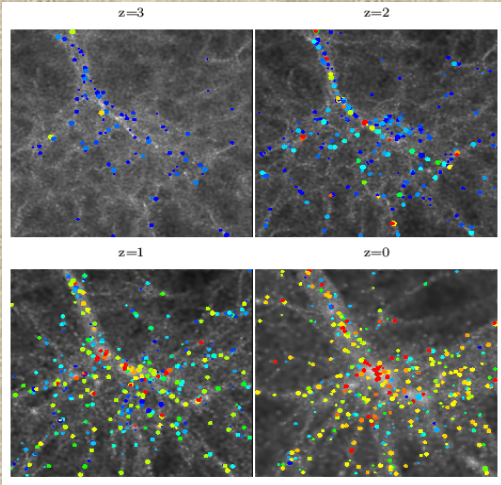
Let's keep in mind that SDSS/2dFGRS did much more...



**Statistical properties  
of the galaxy population  
to high precision**

**Z<0.2: SDSS (Kauffman+)**

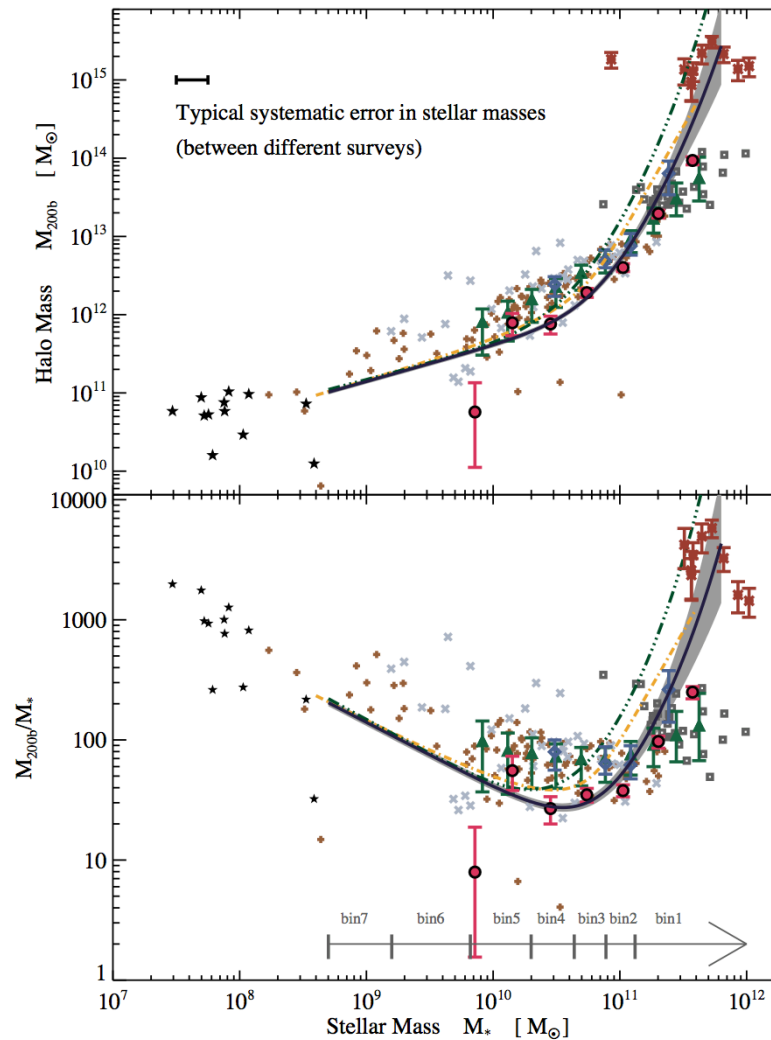
# We need to understand galaxies, to do cosmology...



Kauffman & Diaferio 1998

18

A. Leauthaud et al.

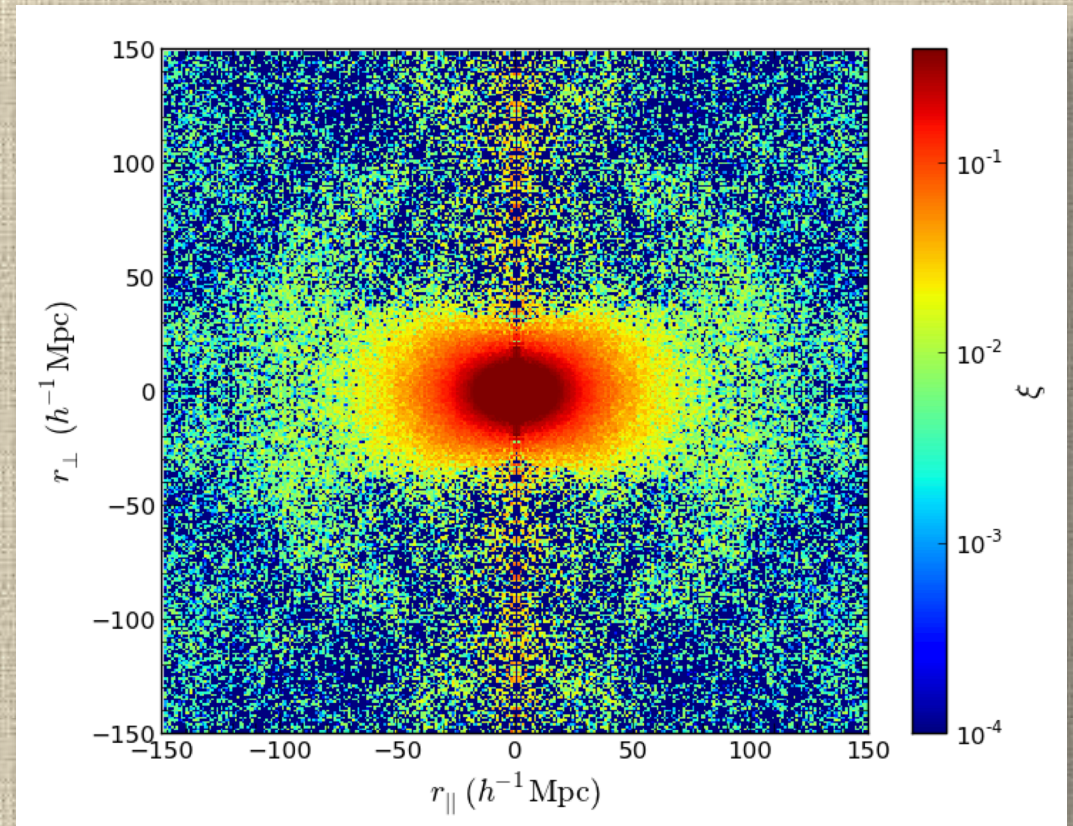
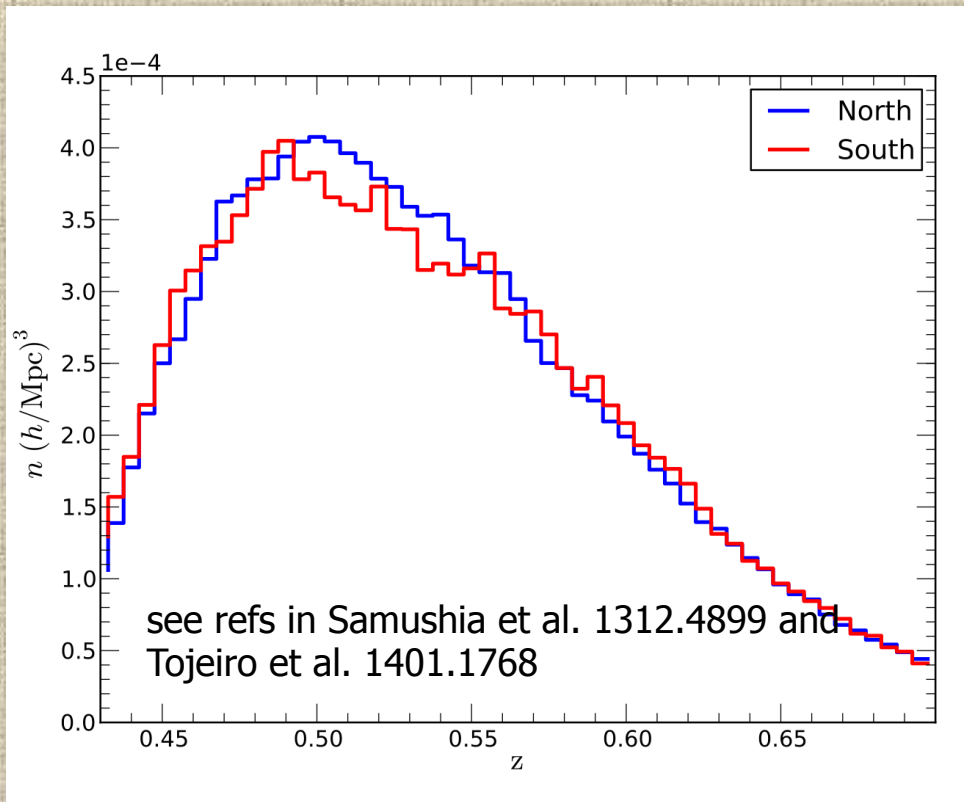


- WL, COSMOS this paper,  $z=0.37$
- WL, Mandelbaum *et al.* 2006,  $z=0.1$
- WL, Leauthaud *et al.* 2010,  $z=0.3$
- ✱ WL, Hoekstra *et al.* 2007,  $z\sim 0.2$
- - - AM, Moster *et al.* 2010,  $z=0.1$
- · - · - AM, Behroozi *et al.* 2010,  $z=0.1$
- ◇ SK, Conroy *et al.* 2007,  $z\sim 0.06$
- △ SK, More *et al.* 2010,  $z\sim 0.05$
- ★ TF, Geha *et al.* 2006,  $z=0$
- × TF, Pizagno *et al.* 2006,  $z=0$
- + TF, Springob *et al.* 2005,  $z=0$

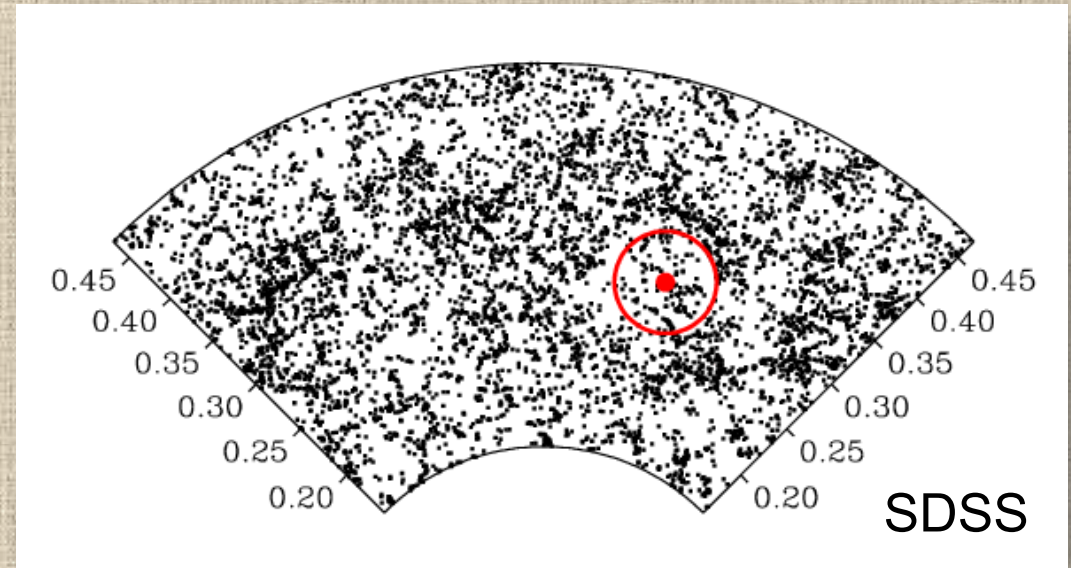
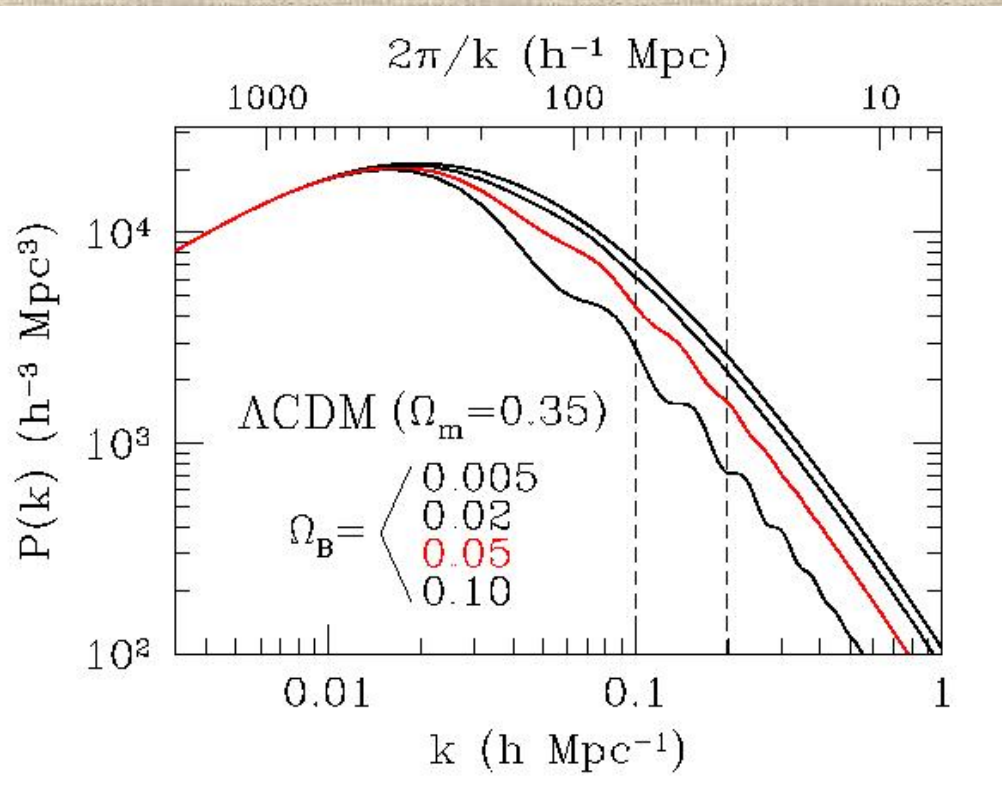
Leauthaud et al. 2012

# Pushing to higher $z$ with a sparse population: e.g. **BOSS**

- **Area=8500 deg<sup>2</sup> , Volume $\sim$ 6 h<sup>-3</sup> Gpc, Ngal = 690,000**
- **“CMASS” LRG-like col-col selection, “loosely selecting constant mass galaxies”**
- **Low-density tracers**
- **Optimized for BAO, not for P(k) shape information (selection function)**
- **Excellent (a posteriori) for Redshift Space Distortions thanks to huge volume**



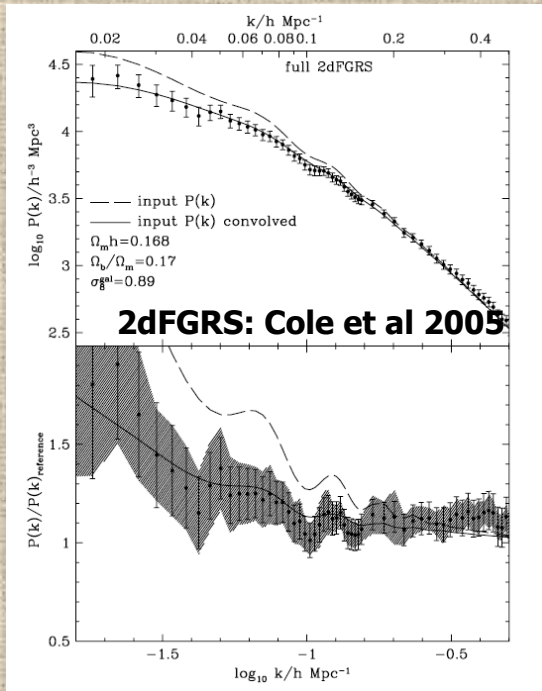
# Baryonic Acoustic Oscillations: a standard ruler to measure $H(z)$



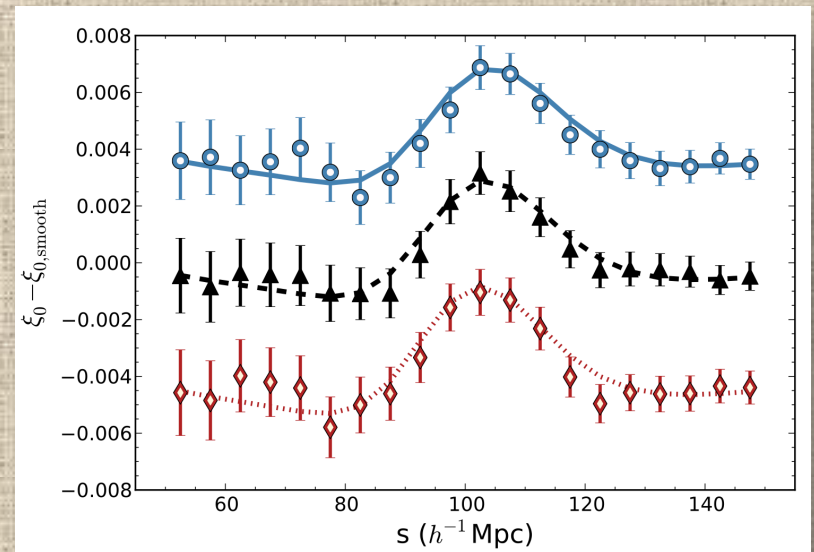
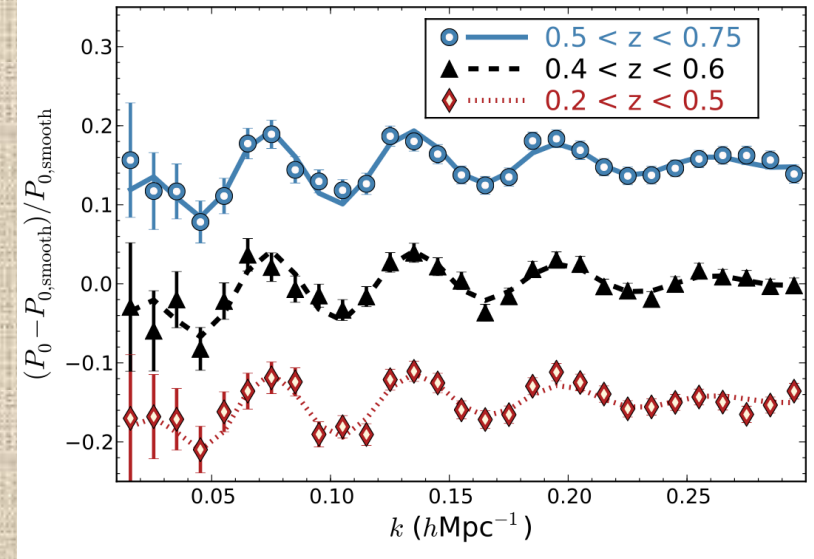


# BAO in galaxy redshift surveys

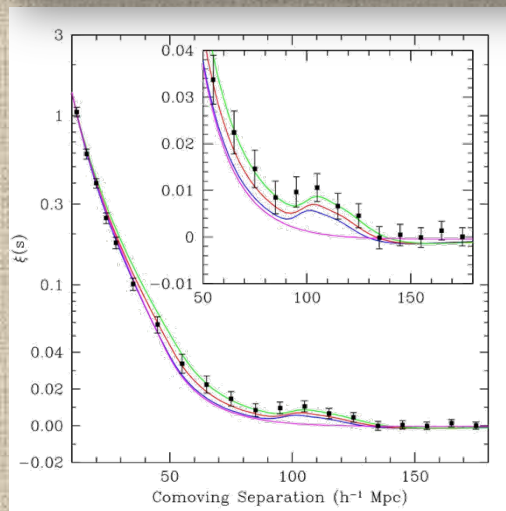
## 2016: Final measurement from BOSS-DR12



**Fourier Space  
(wiggles):**



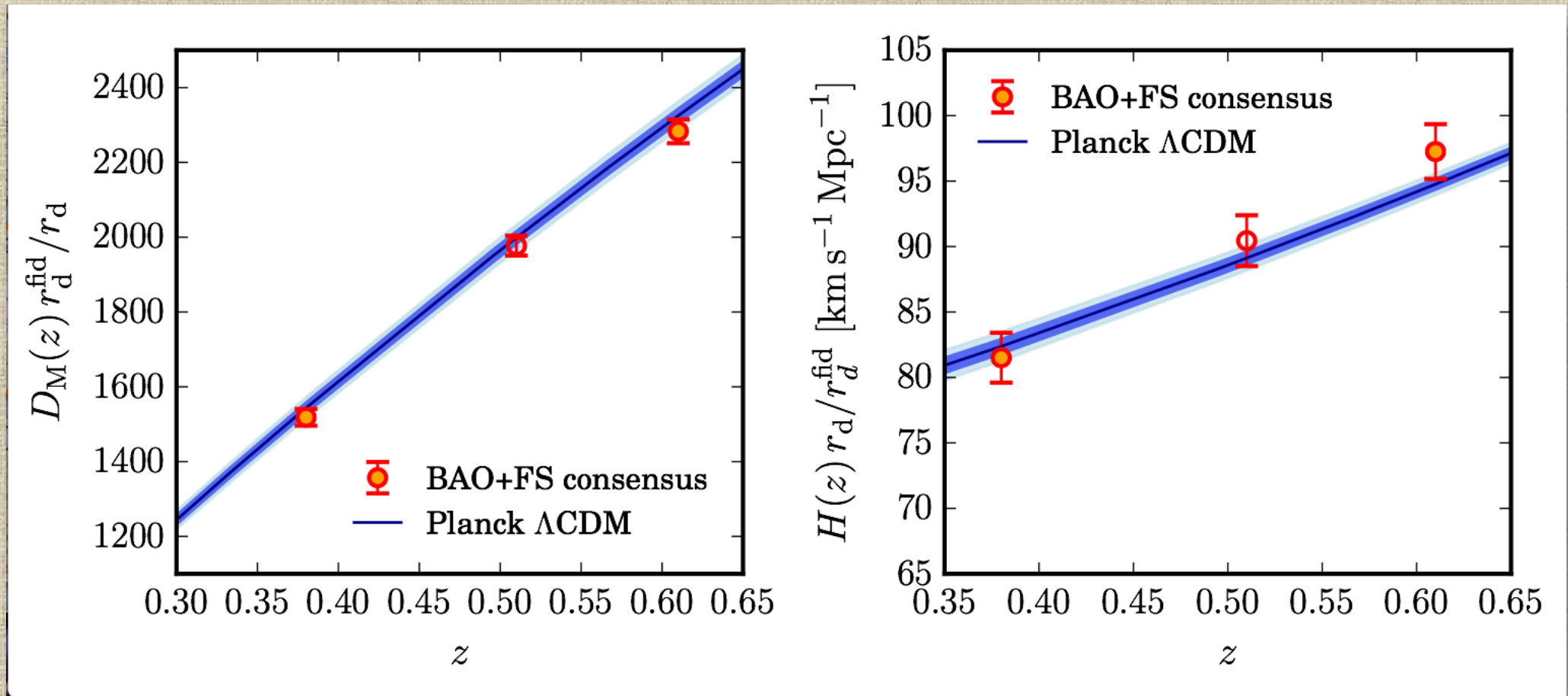
**(BOSS Collaboration 2016, arXiv:1607.03155)**



**Configuration Space  
(BAO peak):**

**SDSS: Eisenstein et al 2005**

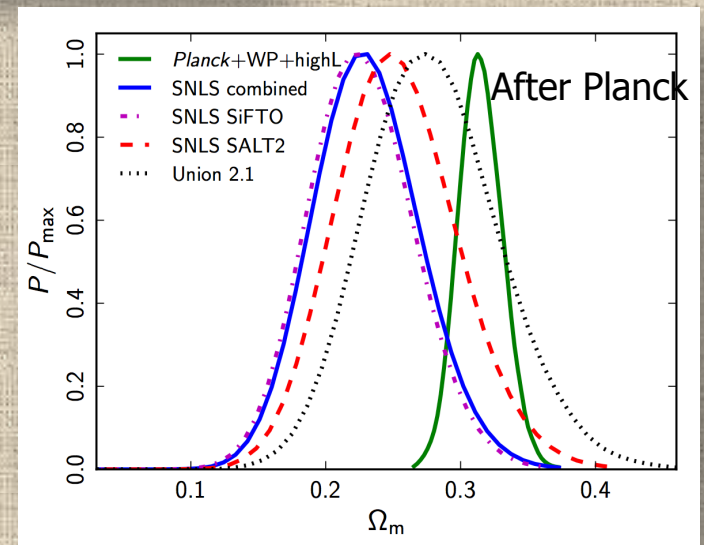
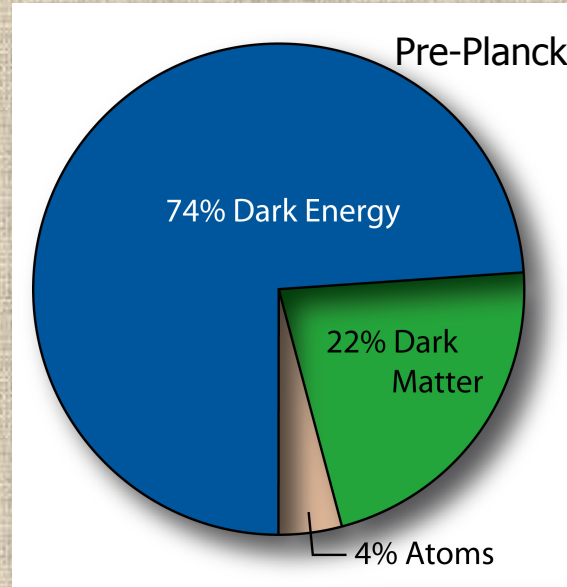
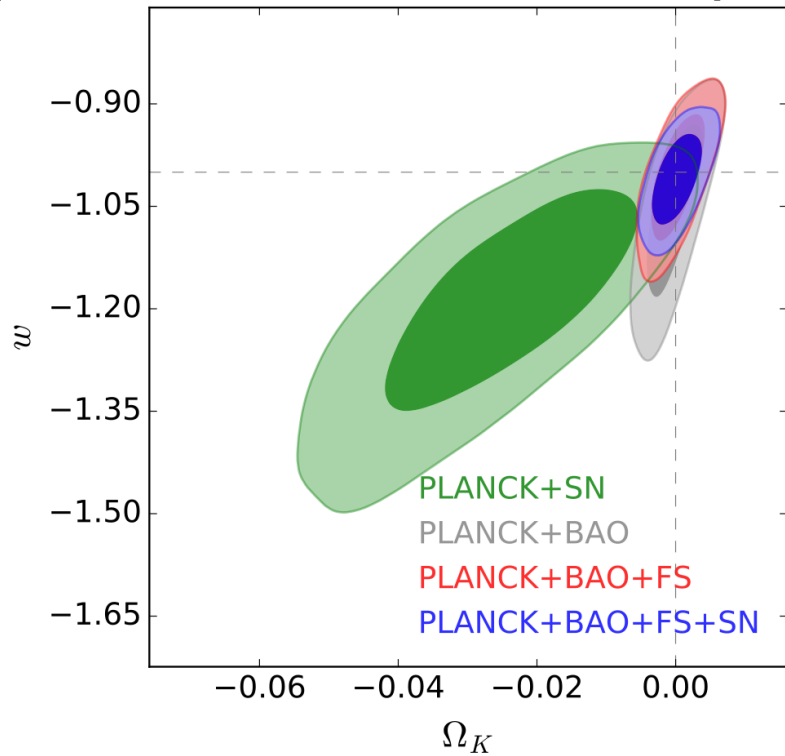
# Probe expansion history with BAO



(BOSS Collaboration 2016)

# Cosmic (quasi) concordance

(BOSS Collaboration 2016, arXiv:1607.03155)



(Planck Collaboration 2013, paper XVI)

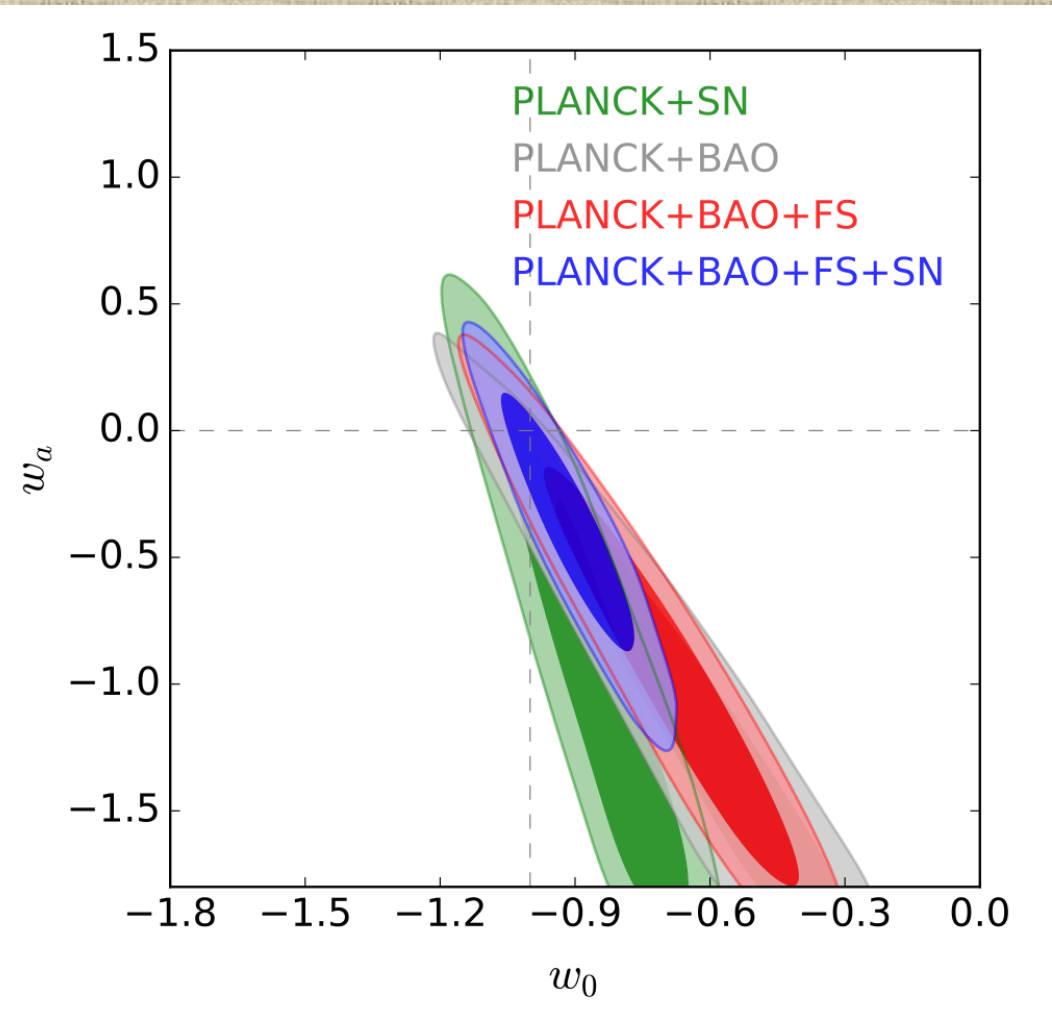
If leaving  $w$  as a free parameter (here with curvature),  $w=-1$  (cosmological constant) remains favoured

$\Lambda$  is too small and fine-tuned: an evolving equation of state  $w(a)$ ?

Parameterizing our ignorance:

$$w(a) = w_0 + w_a(1 - a)$$

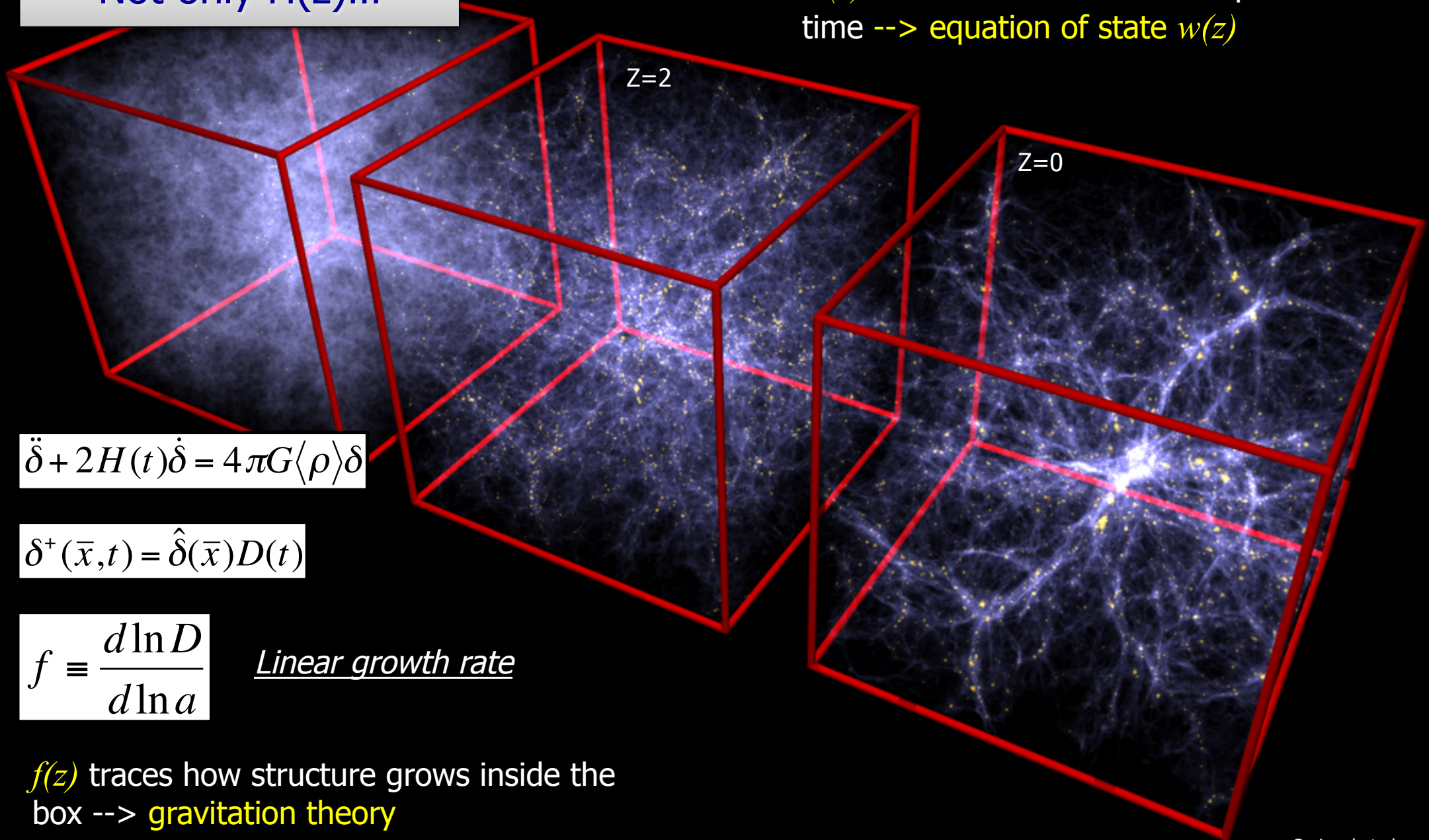
[ $a$  = scale factor of the Universe =  $(1+z)^{-1}$ ]



(BOSS Collaboration 2016, arXiv:1607.03155)

Not only  $H(z)$ ...

$H(z)$  measures how the box expands with time --> equation of state  $w(z)$



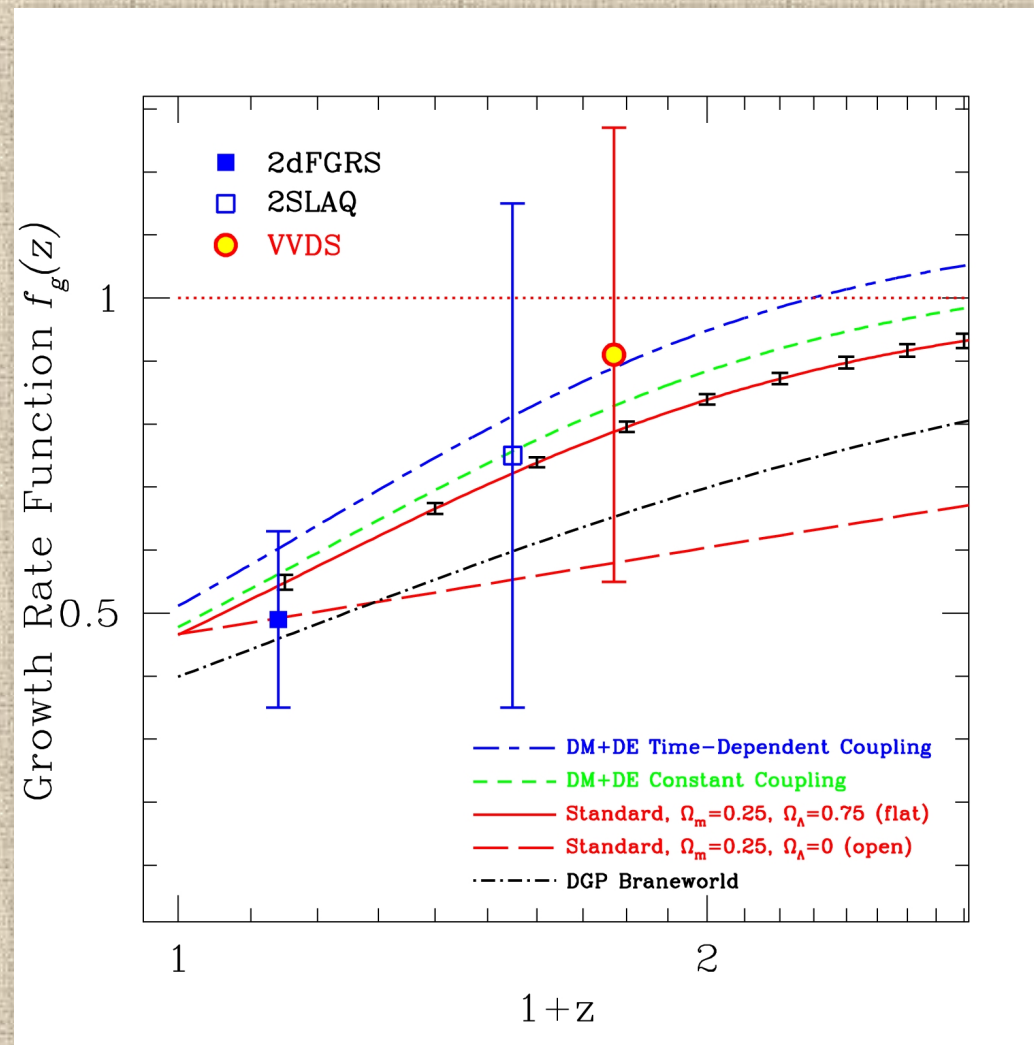
$$\ddot{\delta} + 2H(t)\dot{\delta} = 4\pi G\langle\rho\rangle\delta$$

$$\delta^+(\bar{x}, t) = \hat{\delta}(\bar{x})D(t)$$

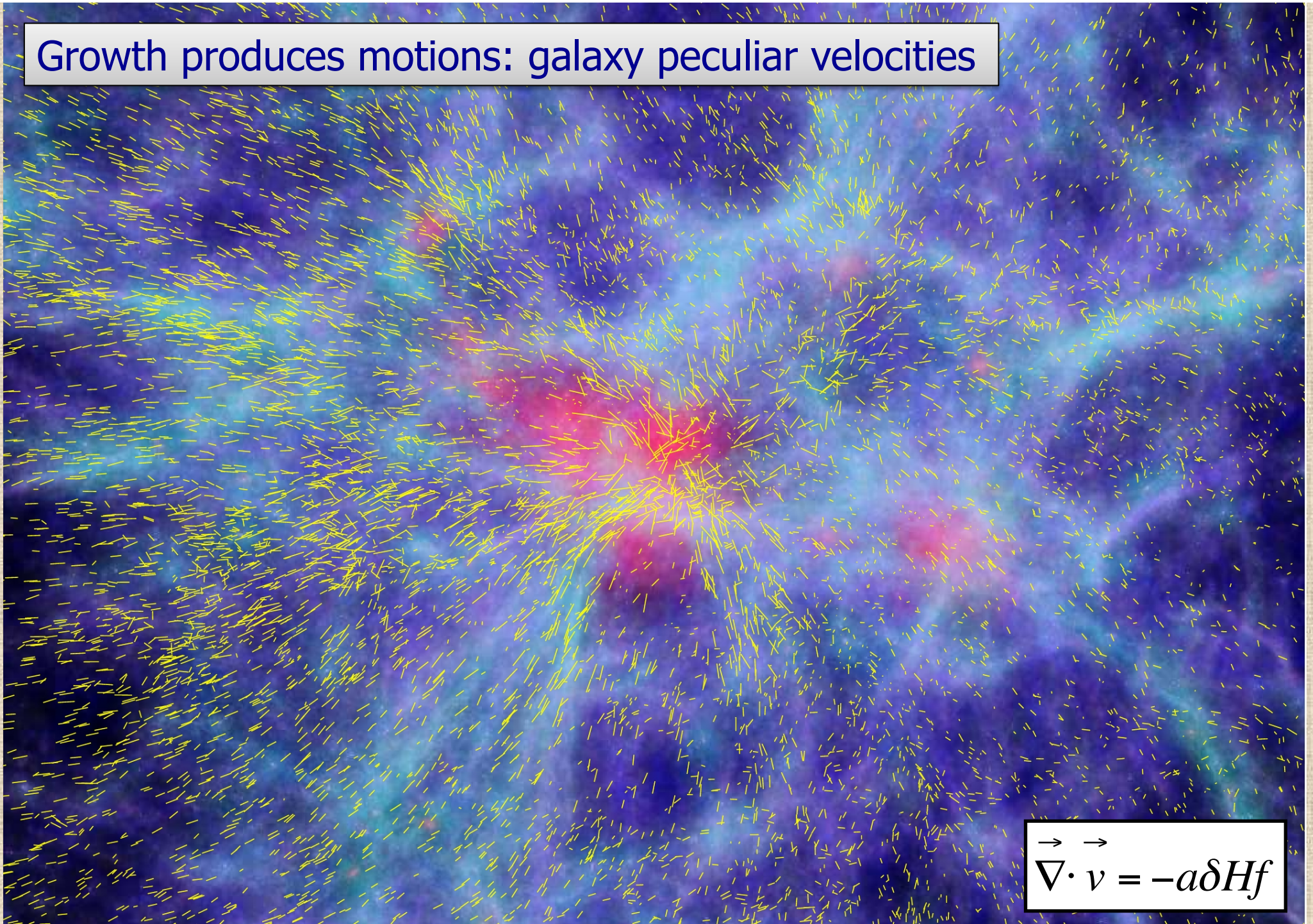
$$f \equiv \frac{d\ln D}{d\ln a} \quad \text{Linear growth rate}$$

$f(z)$  traces how structure grows inside the box --> gravitation theory

# Growth rate of structure probes modified gravity



Growth produces motions: galaxy peculiar velocities

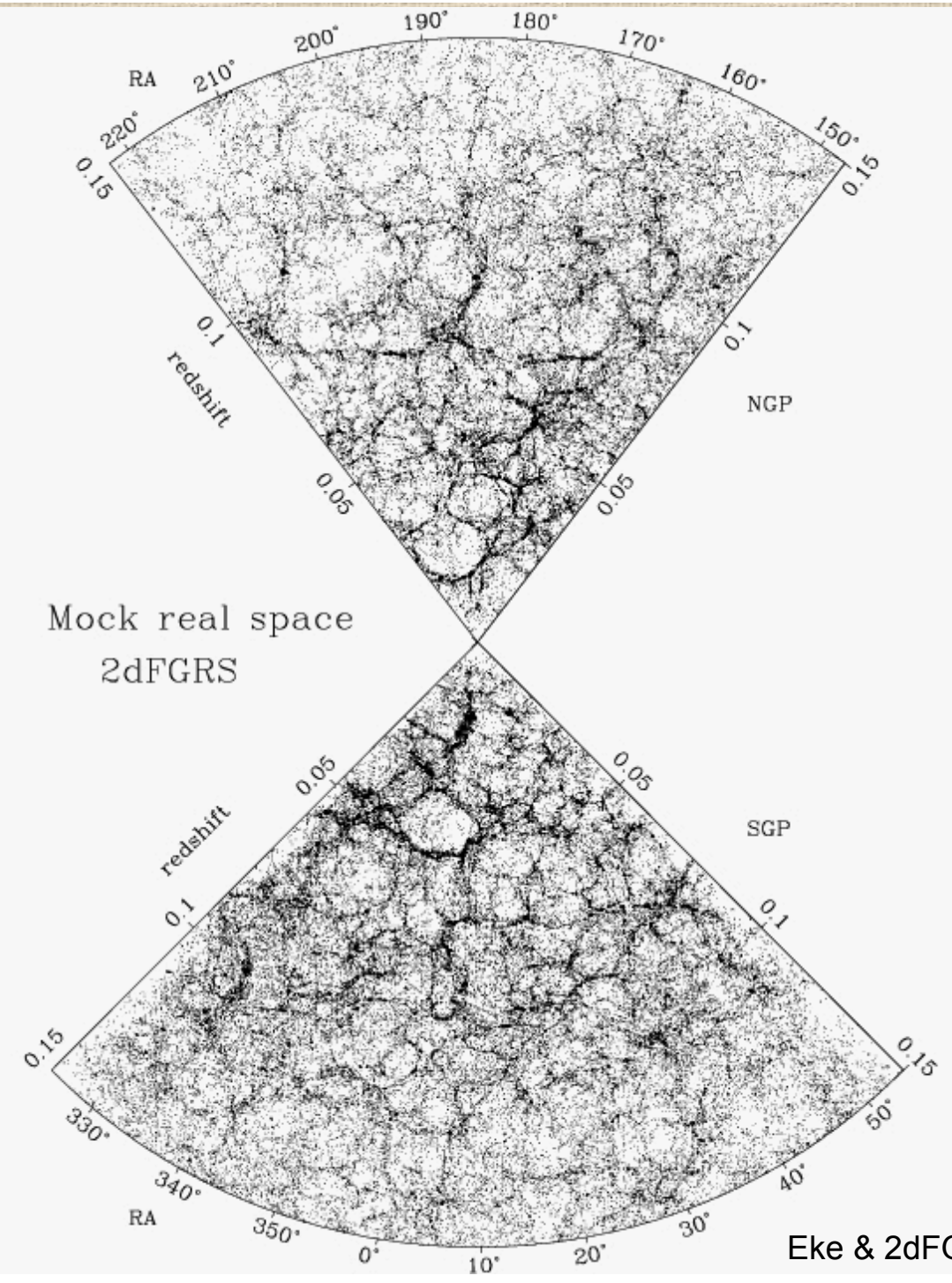


$$\vec{\nabla} \cdot \vec{v} = -a\delta Hf$$

Growth produces peculiar velocities, which manifest themselves in galaxy redshift surveys as redshift-space distortions

**real space**

(Kaiser 1987)



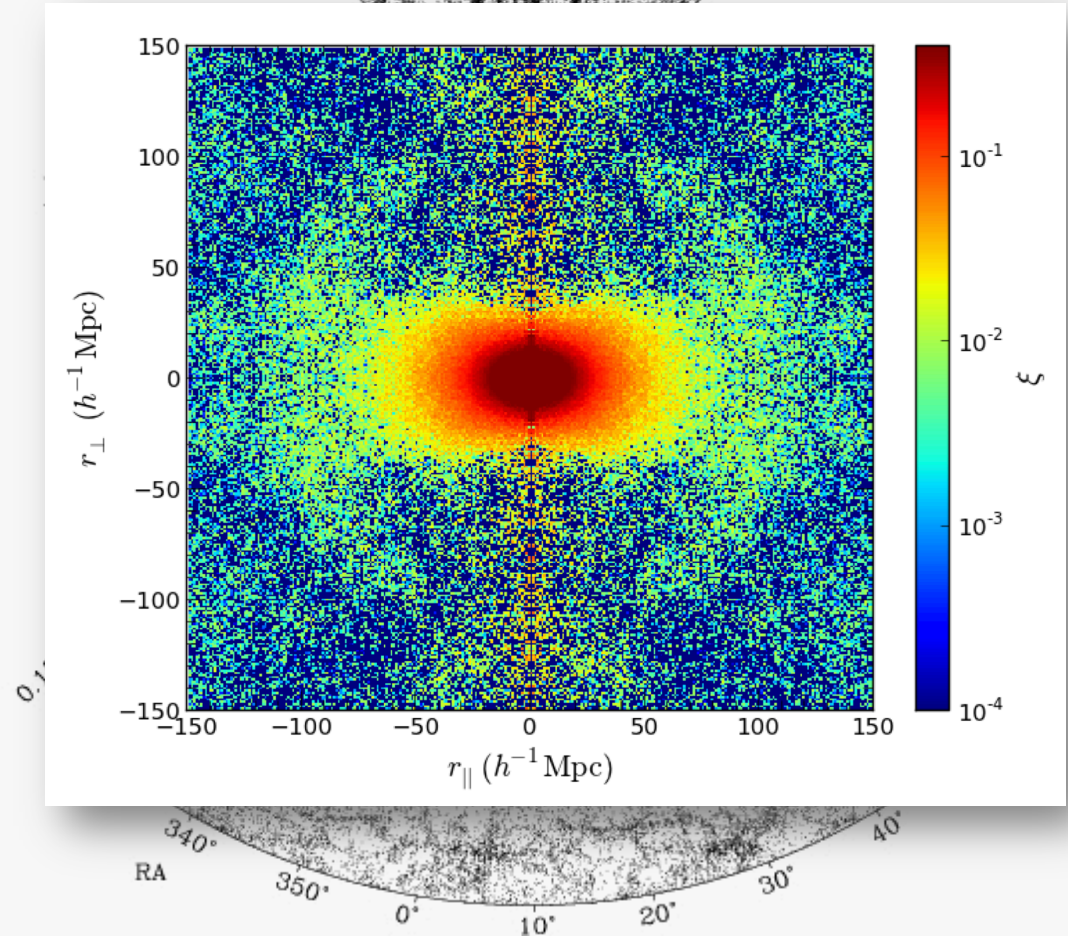
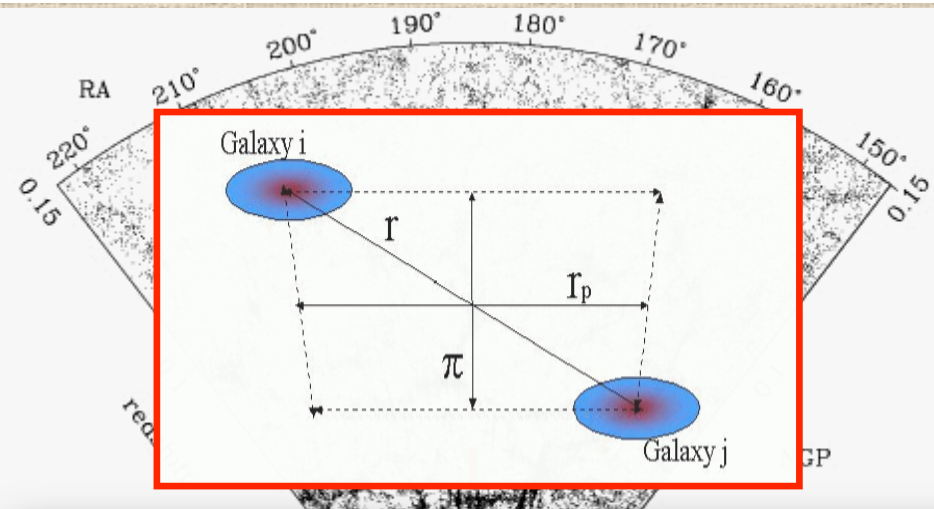
Eke & 2dFGRS 2003



Growth produces peculiar velocities, which manifest themselves in galaxy redshift surveys as redshift-space distortions

**redshift space**

(Kaiser 1987)



# VIPERS in the context of modern LSS surveys



Astronomy & Astrophysics manuscript no. scodeggio\_PDR2\_v2.5  
November 23, 2016

©ESO 2016

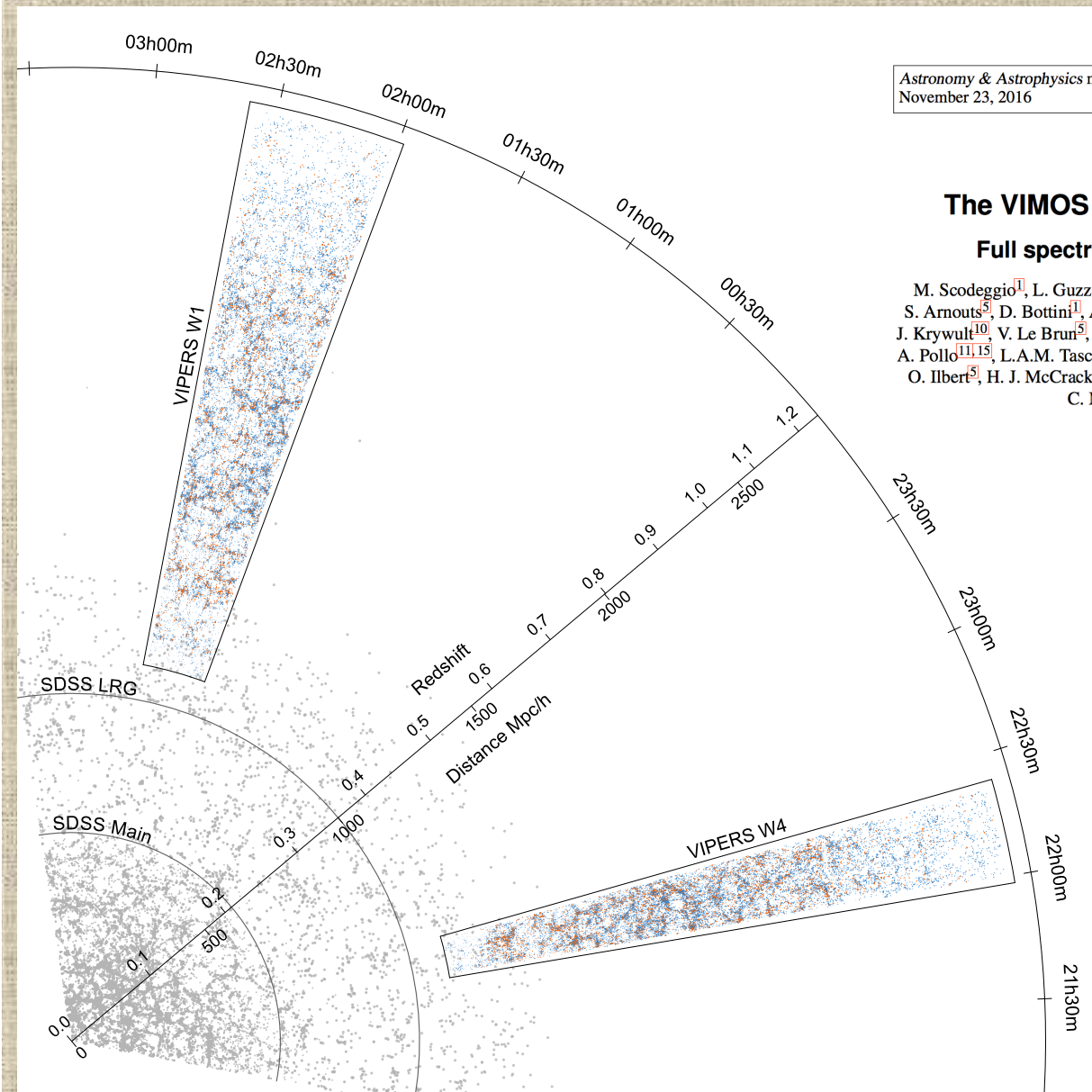
## The VIMOS Public Extragalactic Redshift Survey (VIPERS)\*

### Full spectroscopic data and auxiliary information release (PDR-2)

M. Scodeggio<sup>1</sup>, L. Guzzo<sup>2,3</sup>, B. Garilli<sup>1</sup>, B. R. Granett<sup>2,3</sup>, M. Bolzonella<sup>4</sup>, S. de la Torre<sup>5</sup>, U. Abbas<sup>6</sup>, C. Adami<sup>5</sup>, S. Arnouts<sup>5</sup>, D. Bottini<sup>1</sup>, A. Cappi<sup>4,7</sup>, J. Coupon<sup>8</sup>, O. Cucciati<sup>9,4</sup>, I. Davidzon<sup>5,4</sup>, P. Franzetti<sup>1</sup>, A. Fritz<sup>1</sup>, A. Iovino<sup>2</sup>, J. Krywul<sup>10</sup>, V. Le Brun<sup>5</sup>, O. Le Fèvre<sup>5</sup>, D. Maccagni<sup>1</sup>, K. Malek<sup>11</sup>, A. Marchetti<sup>1</sup>, F. Marulli<sup>9,12,4</sup>, M. Polletta<sup>1,13,14</sup>, A. Pollo<sup>11,15</sup>, L.A.M. Tasca<sup>5</sup>, R. Tojeiro<sup>16</sup>, D. Vergani<sup>17</sup>, A. Zanichelli<sup>18</sup>, J. Bel<sup>19</sup>, E. Branchini<sup>20,21,22</sup>, G. De Lucia<sup>23</sup>, O. Ilbert<sup>5</sup>, H. J. McCracken<sup>24</sup>, T. Moutard<sup>25,5</sup>, J. A. Peacock<sup>26</sup>, G. Zamorani<sup>4</sup>, A. Burden<sup>27</sup>, M. Fumana<sup>1</sup>, E. Jullo<sup>9</sup>, C. Marinoni<sup>19,28</sup>, Y. Mellier<sup>24</sup>, L. Moscardini<sup>9,12,4</sup>, and W. J. Percival<sup>27</sup>

**Table 2.** The VIPERS PDR-2 spectroscopic sample

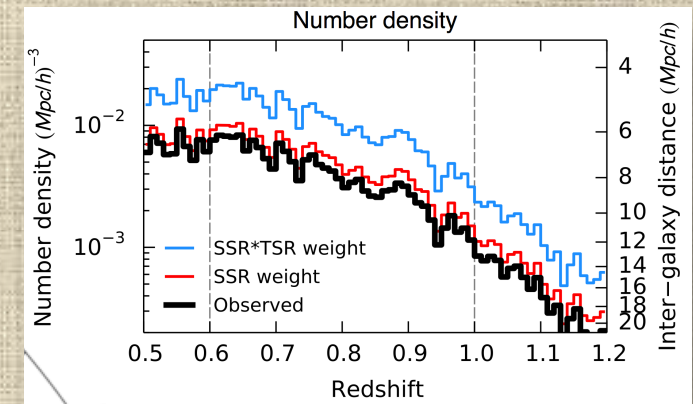
Sample	Number
Spectroscopically observed	97,414
— Main survey targets	94,335
— Serendipitous targets	1,478
— AGN candidates (not part of main survey)	1,601
Measured redshifts	Number
All measured	91,507
Main survey, all targets	89,022
— galaxies	86,775
— stars	2,247
Flag $\geq 2$ main survey, all targets	78,586
Flag $\geq 2$ main survey, galaxies	76,552



# VIPERS fact sheet



- Probes  $0.4 < z < 1.2$ , with volume and density comparable to  $z=0$  reference surveys ( $\sim 2dFGRS$ )
- $\sim 24 \text{ deg}^2$ ,  $I_{AB} < 22.5$ ,  $z > 0.5$  color-color pre-selection (+ accurate star-galaxy separation)
- Volume:  $5 \times 10^7 h^{-3} \text{ Mpc}^3$ ,  $\sim 10^4$  redshifts
- 47% sampling
- $\langle n \rangle \sim 5 \times 10^{-3} h^3 \text{ Mpc}^{-3}$
- **CFHTLS Wide** (W1 and W4 fields,  $\sim 16 + 8 \text{ deg}^2$ ) 5-band accurate photometry and high-quality images
- **VIPERS Multi-Lambda Survey** (Arnouts+, Moutard+2016a,b): revised CFHTLS ugriz + extra UV & NIR (<http://cesam.lam.fr/vipers-mls/>)
- VIMOS @ VLT, LR Red grism, **45 min exposure**
- Mosaic of **288 pointings, 440.5 hours** (55 VLT night-equivalent)  $\rightarrow$  **2008-2015**
- Expected # was 100,000 spectra; observed 97,414 in total





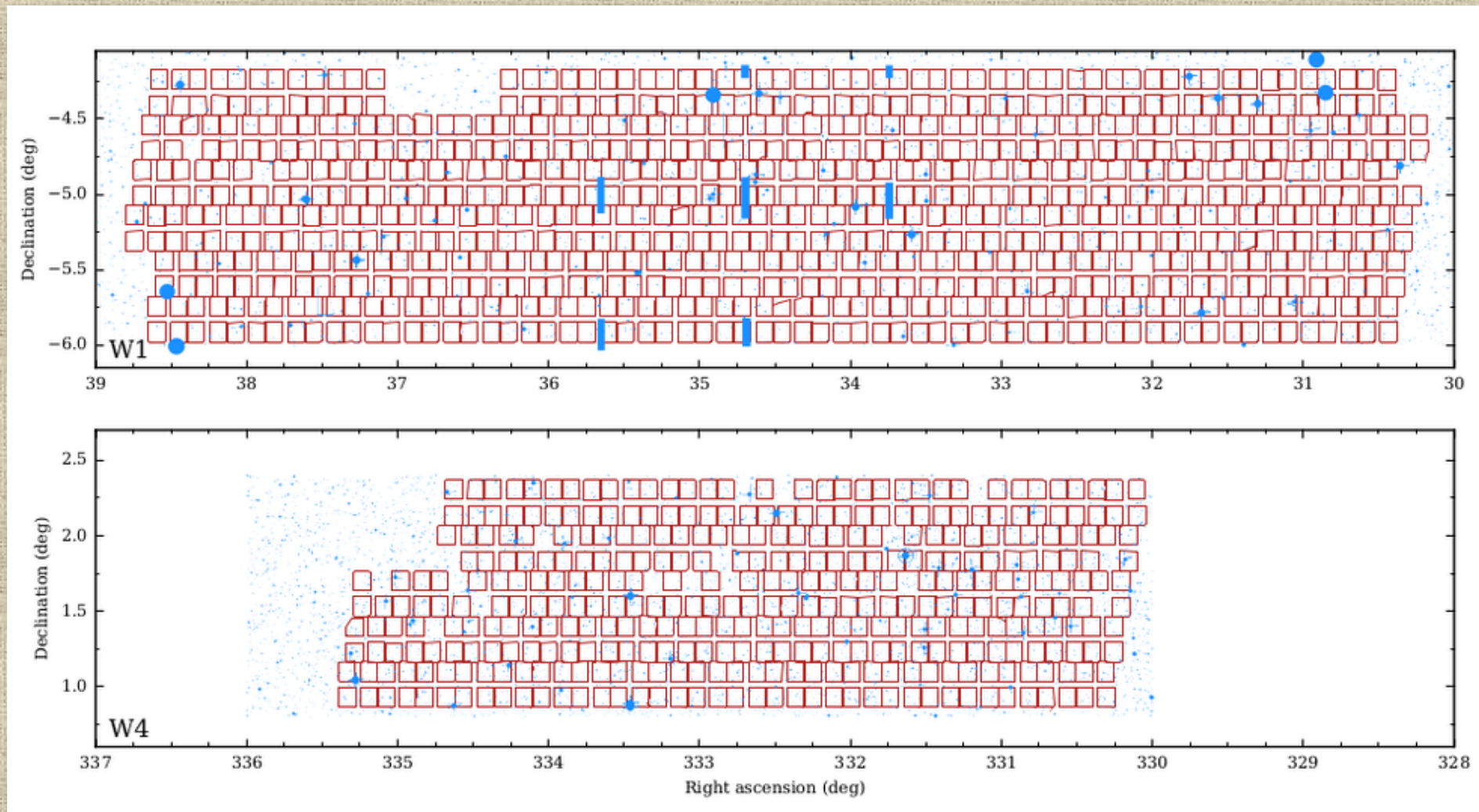
# VIPERS Team

(see <http://vipers.inaf.it>)





# Survey layout and photometric/spectroscopic masks



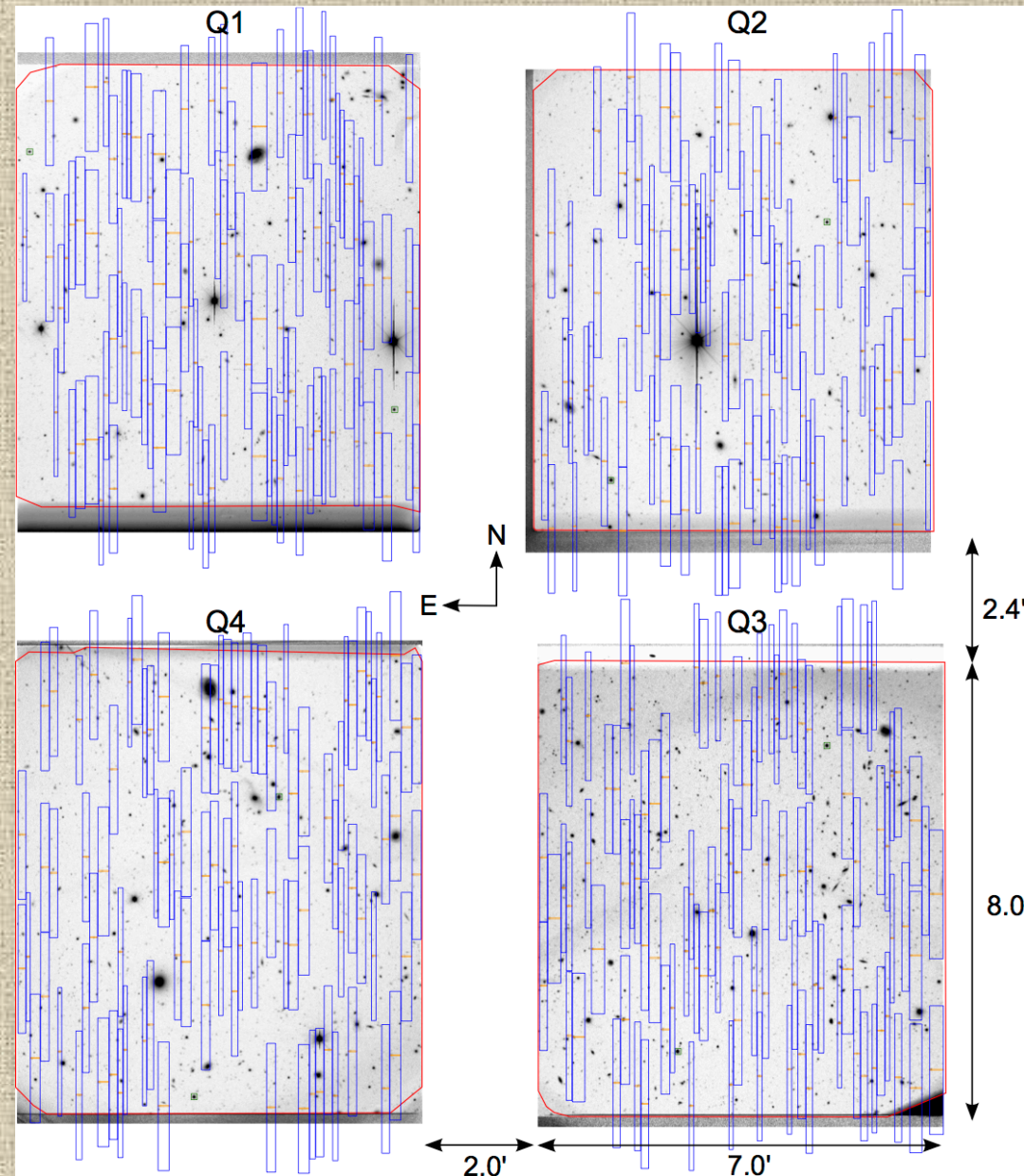
→ This and other ancillary information also released with PDR-2

(mask reconstruction by Ben Granett)

# VIPERS single-shot footprint on the sky



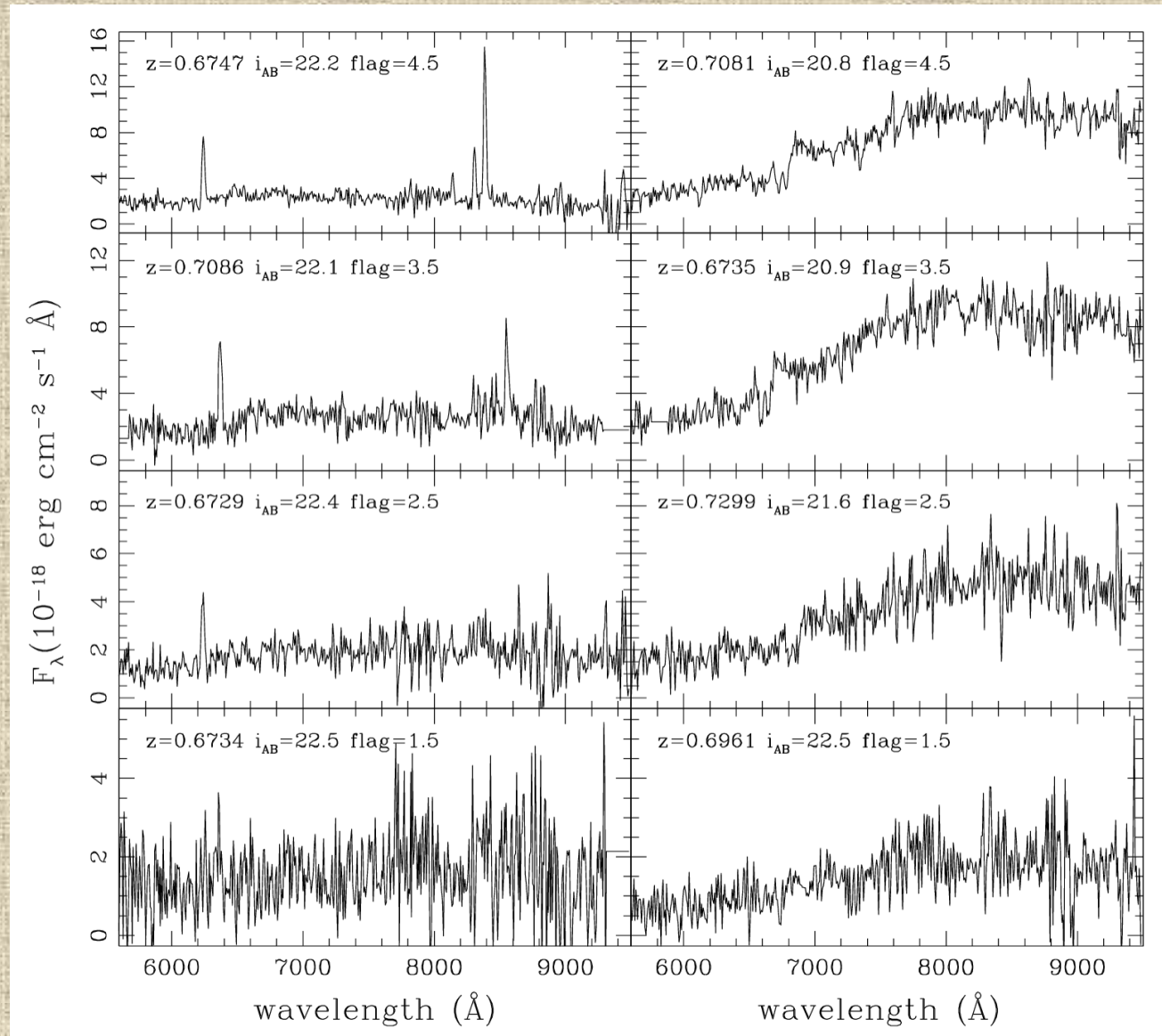
- On average, 360 spectra observed per VIMOS pointing, given VIPERS target sample surface density and clustering
- VIPERS strategy yields mean spatial density  $\langle n \rangle \sim 10^{-2} h^3 \text{ Mpc}^{-3}$  within the range of interest



# VIPERS spectra

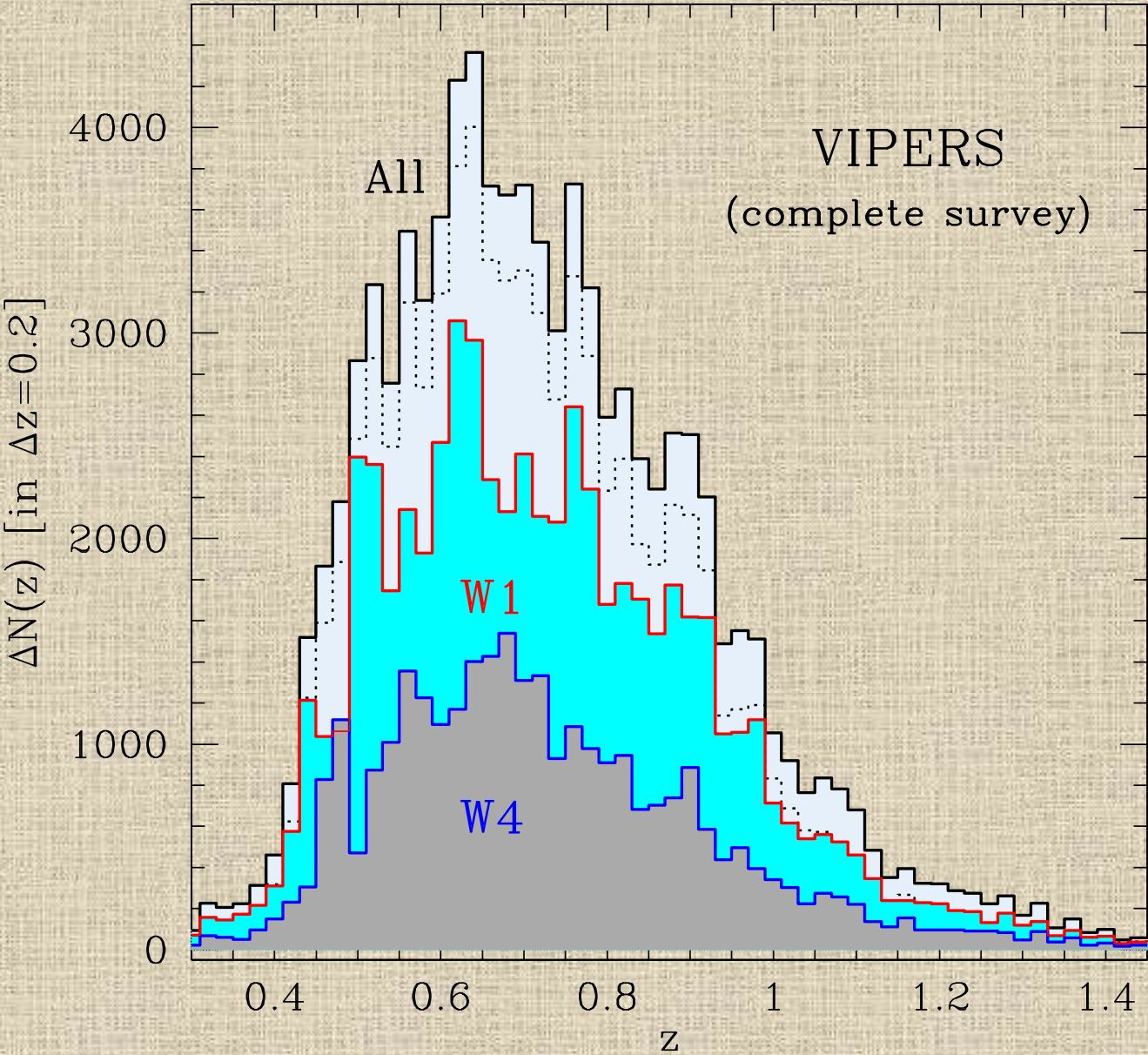


- **$R=220$  at mid-range**
- **$\lambda = 5500 - 9500 \text{ \AA}$**
- **$\sigma_z = 0.00054(1+z)$**
- **Spectral indices and line fluxes** (e.g. D4000, [OII]3727), available for large fraction of sample



(Scodreggio+ 2016)

# PDR-2 redshift distribution

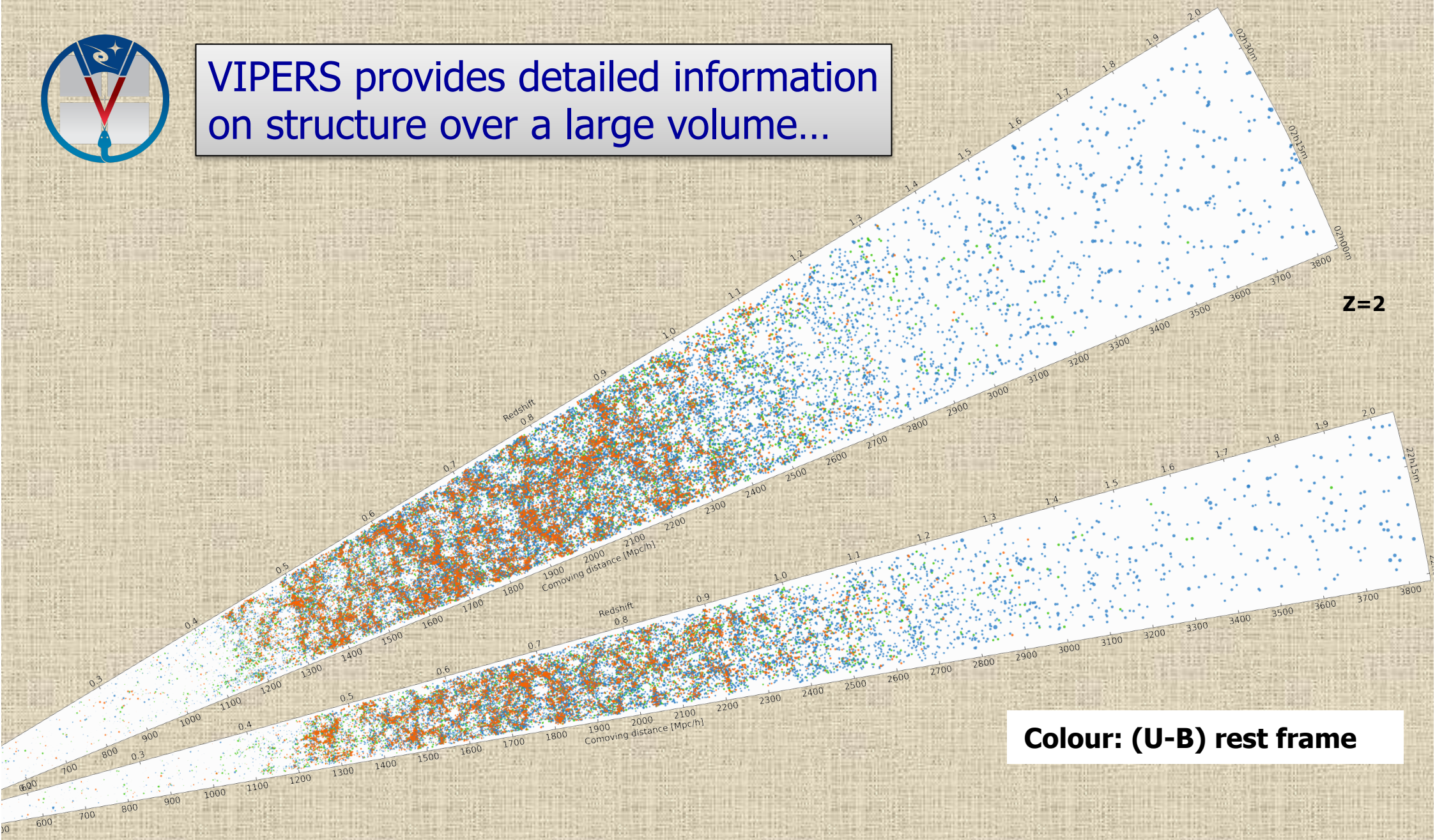


(Scodreggio+ 2016)





VIPERS provides detailed information on structure over a large volume...

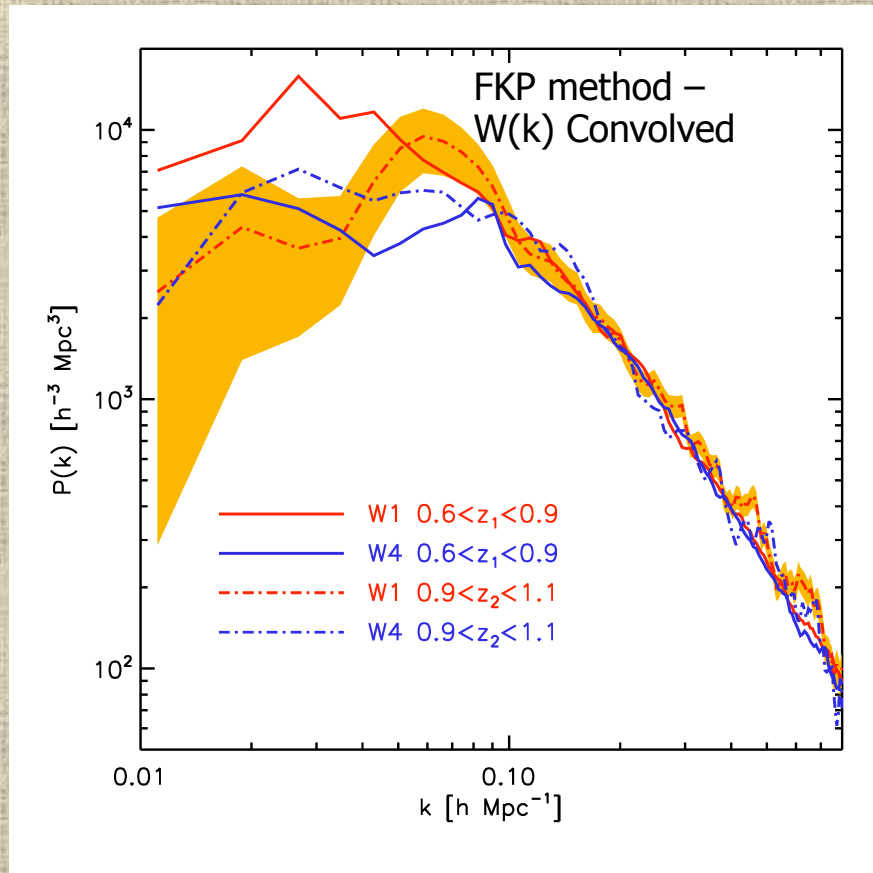


**Colour: (U-B) rest frame**

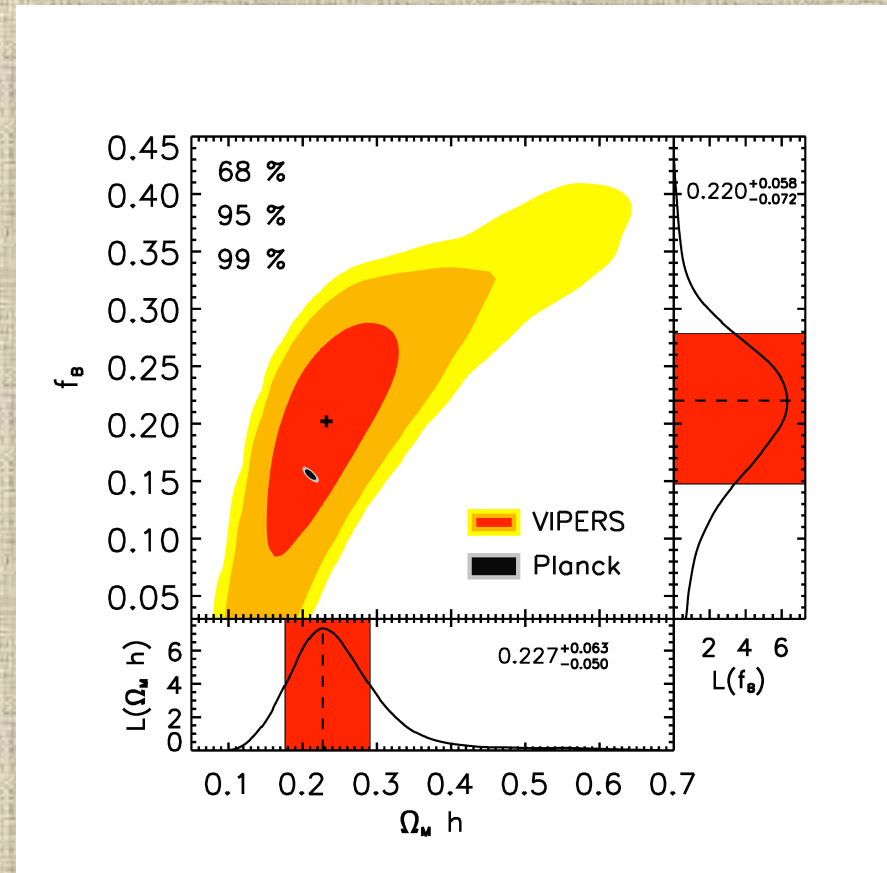
**(artwork by Ben Granett)**

# The power spectrum of the galaxy distribution at $z=0.5-1.1$

(S. Rota PhD thesis, & Rota, Granett+ 1611.07044)



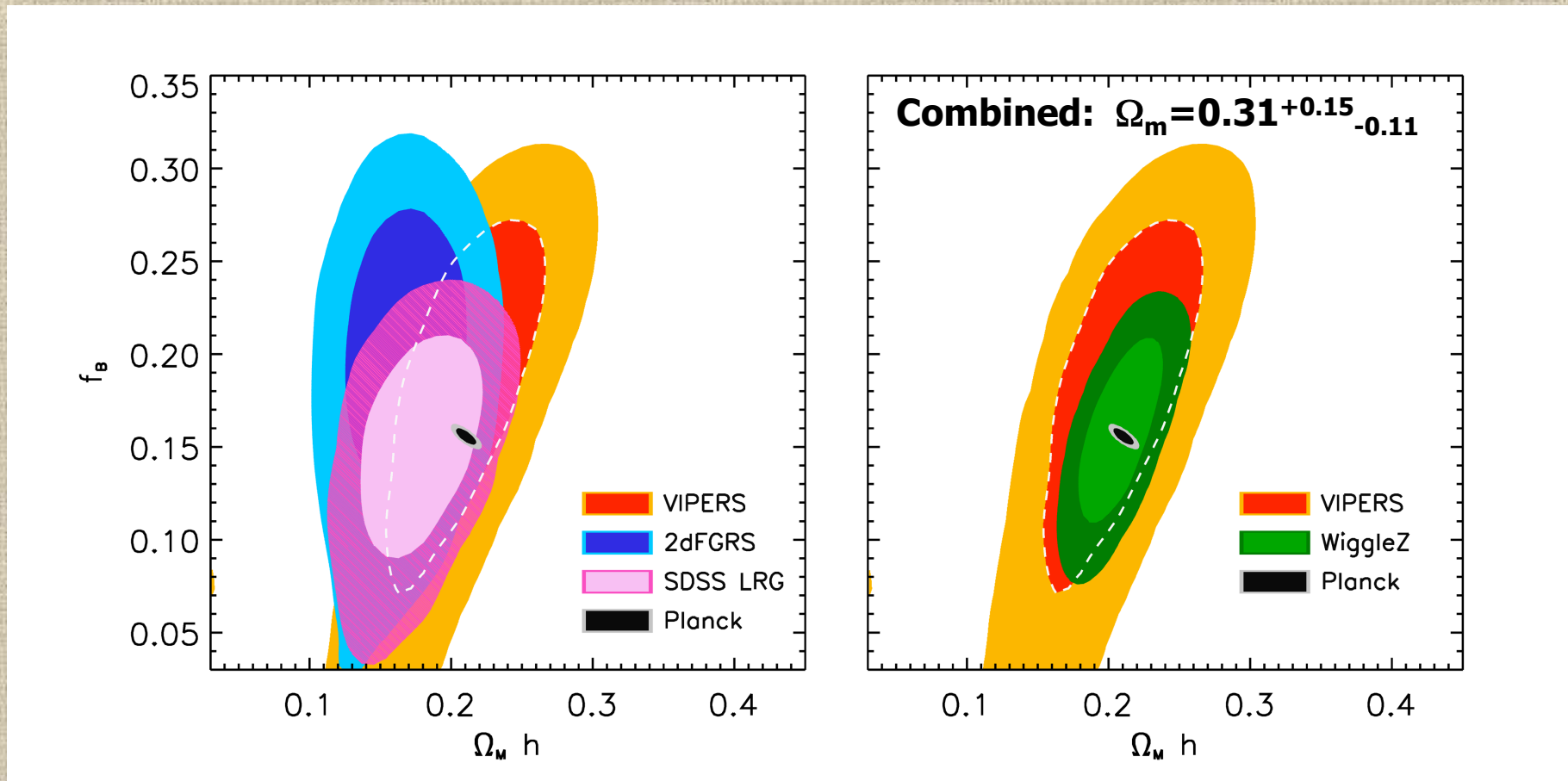
- Very careful tests of window function and nonlinear effects



- Joint likelihood of 4 independent estimates: 2 z bins in 2 fields (W1 and W4)

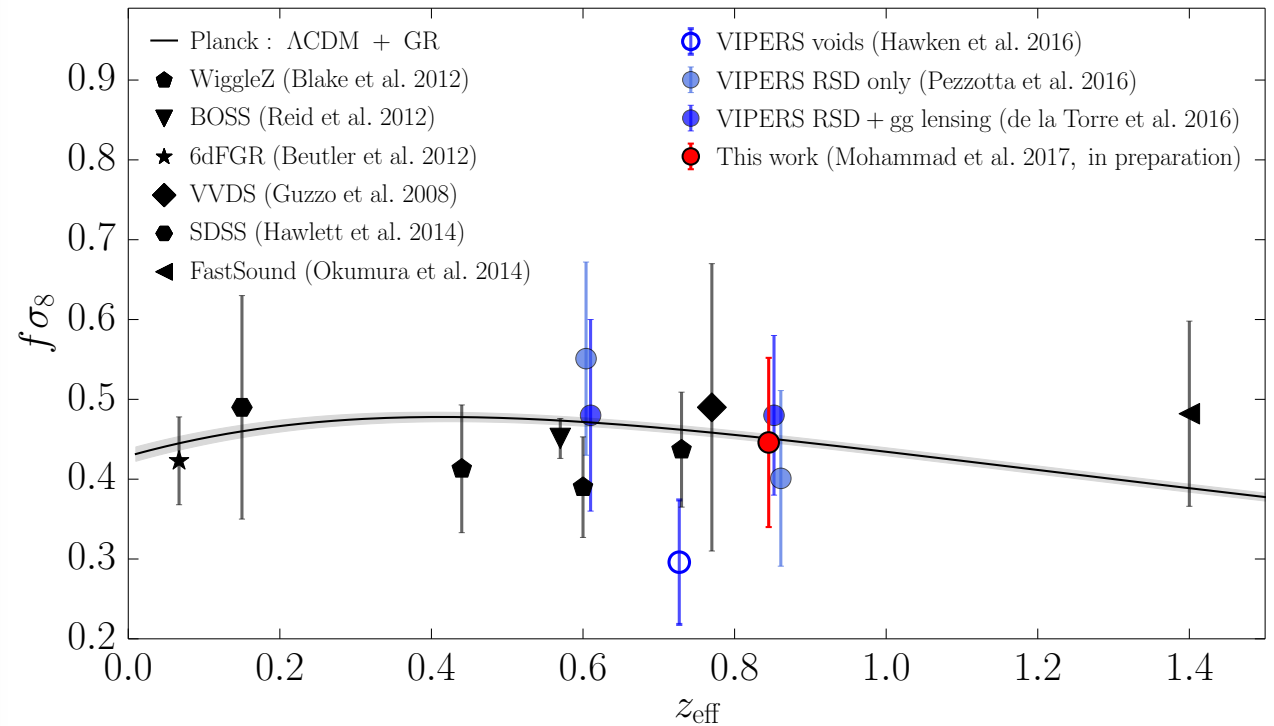
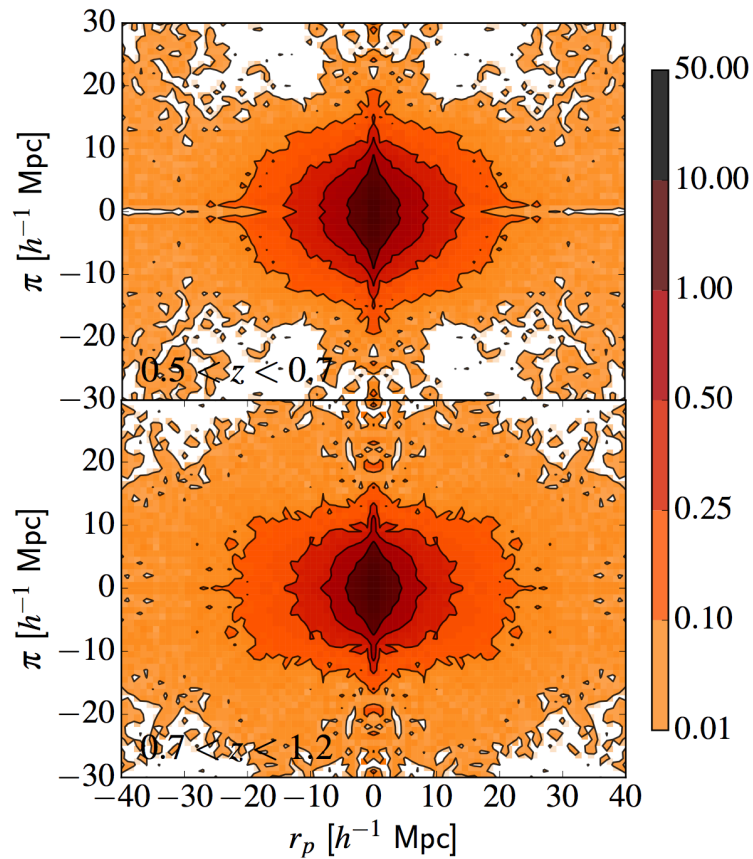
## The power spectrum of the galaxy distribution at $z=0.5-1.1$

- Highest redshift where  $P(k)$  has been measured using galaxy distribution
- Consistency test of LCDM at about half Hubble time, straddling Planck and local values
- **Ellipses move towards Planck moving to higher  $z$  ?**





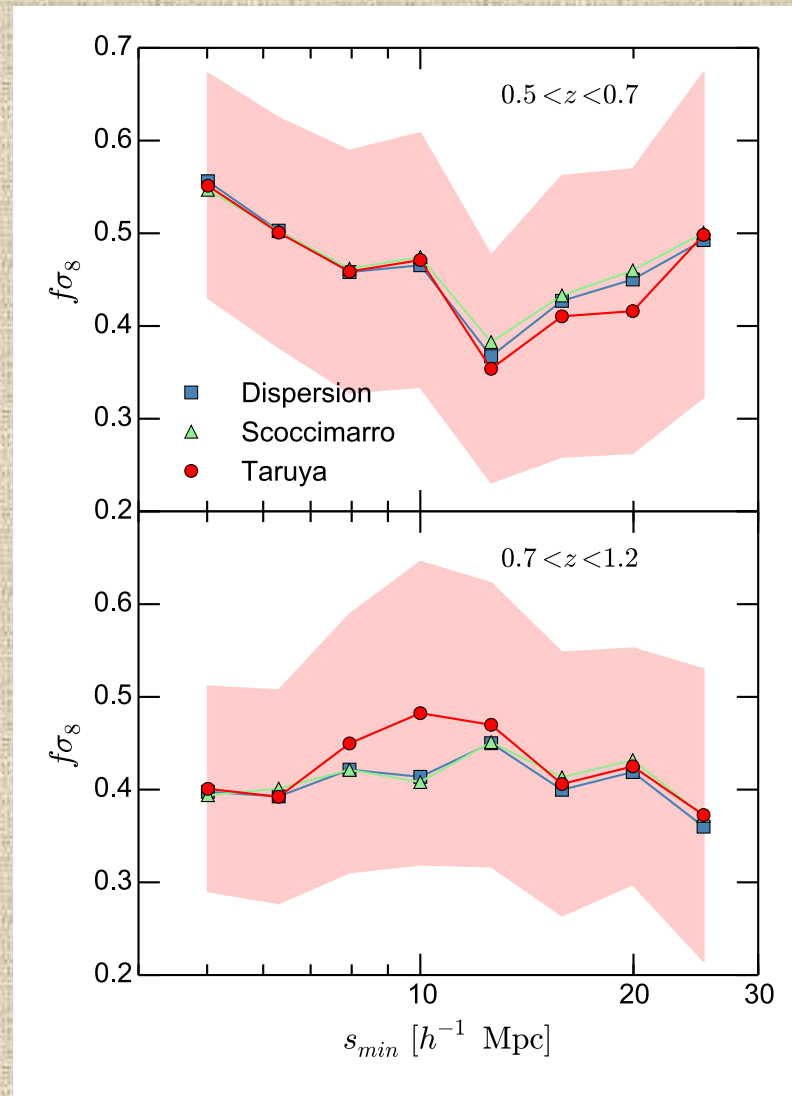
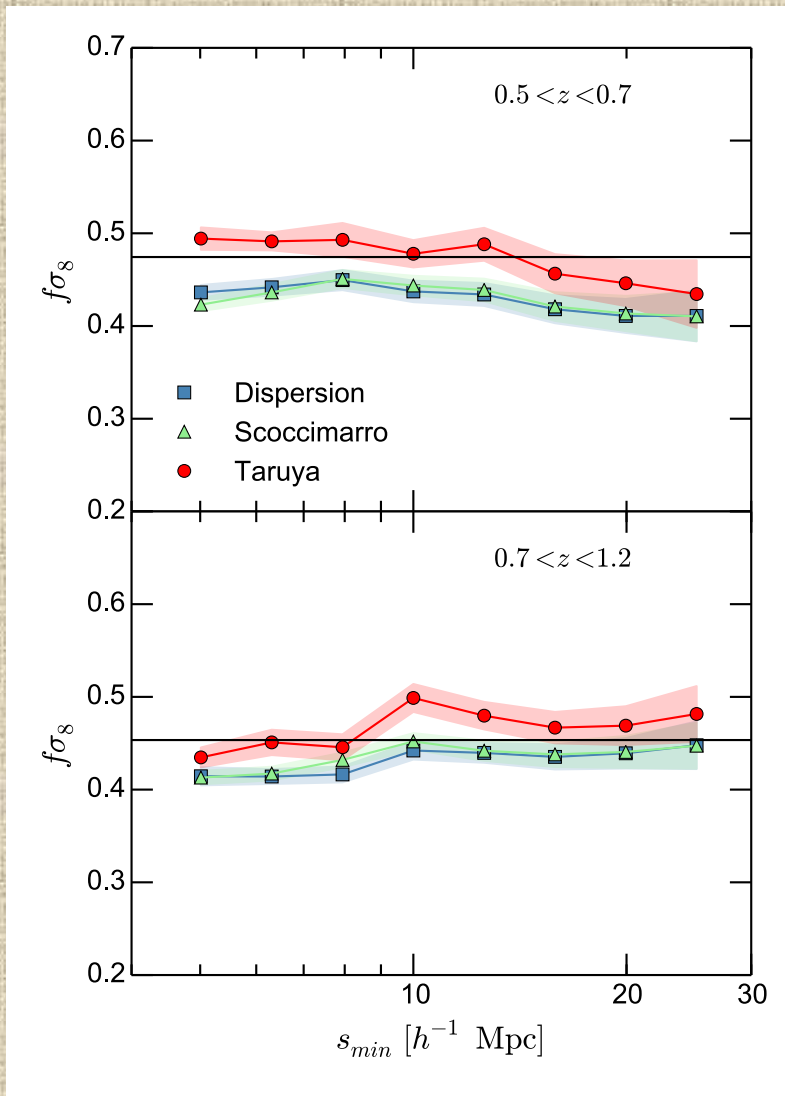
# Testing gravity with redshift-space distortions



VIPERS PDR-2 (Pezzotta+ 2017; de la Torre+ 2017; Hawken+ 2017; Mohammad+ 2017; Wilson 2017)

# Refine nonlinear modelling

(Pezzotta+ 1612.05645; Bel et al., in preparation)

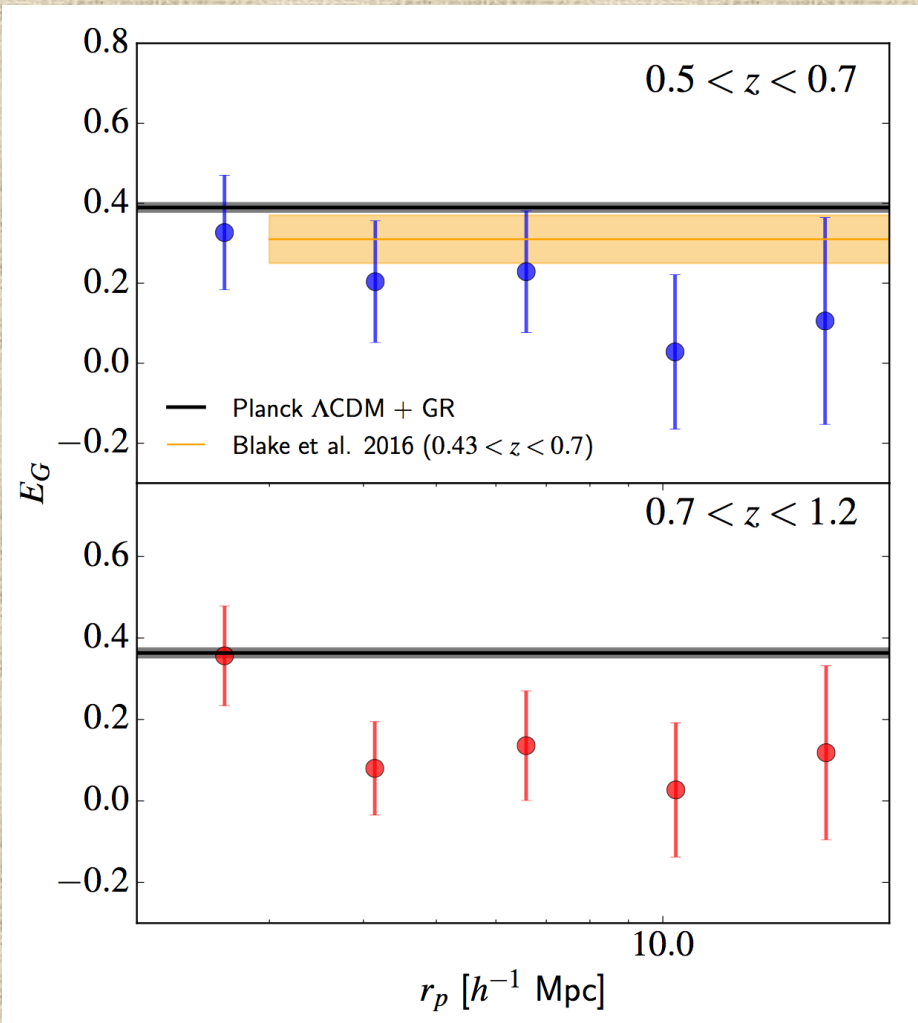


→ Using new improved fitting formulae for velocity divergence / density power spectra (Bel et al. in prep.)

→ (See also Bianchi et al. 2014, 2016)

# Combine galaxy clustering and weak lensing

- Test for modified gravity combining CFHTLenS imaging with VIPERS final data release PDR-2 (de la Torre + VIPERS Team 2017): **Slip parameter**



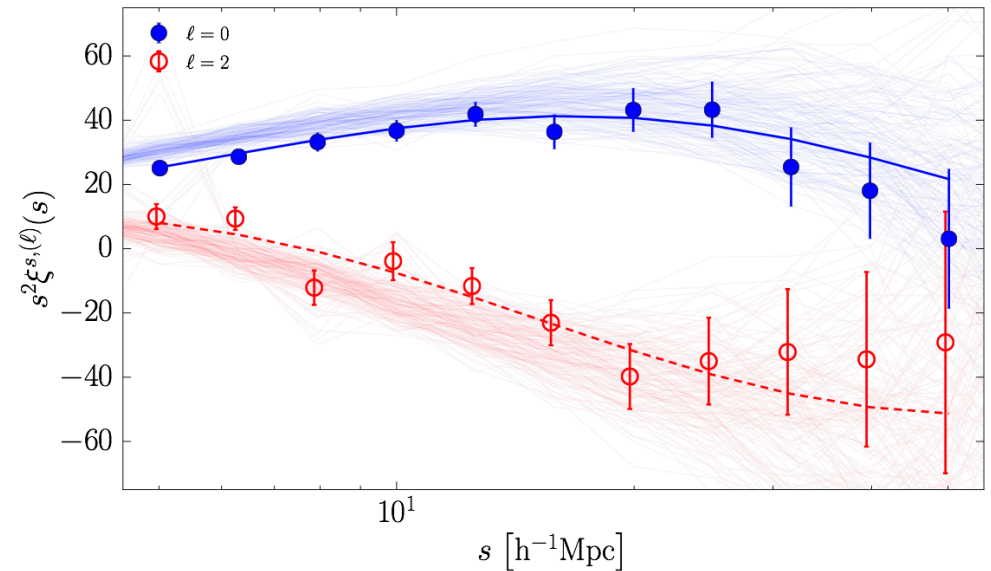
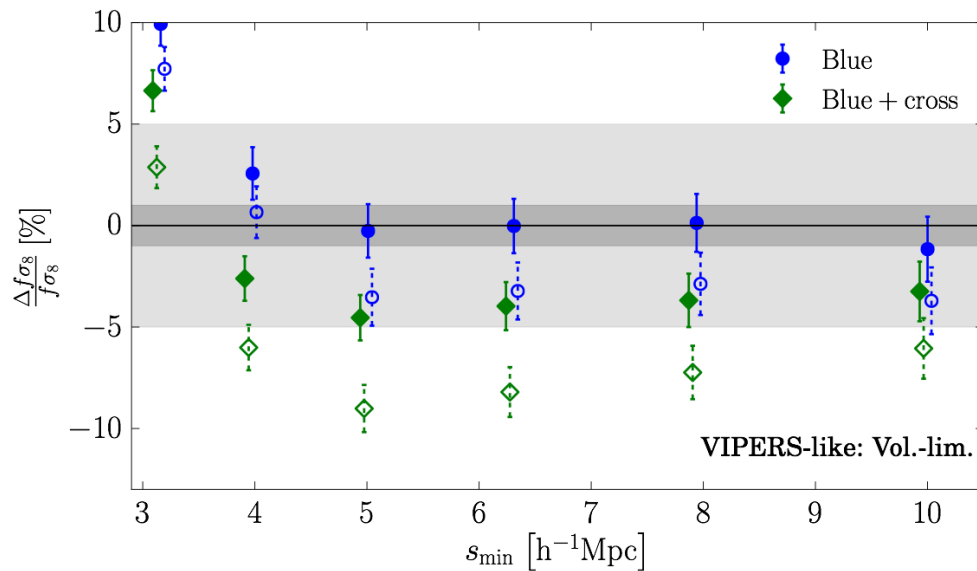
**Complementarity of galaxy clustering and weak gravitational lensing: control systematic effects**

**(proof of concept for Euclid)**

(see also Zhang et al. 2007; Reyes et al. 2009)

# Optimise galaxy tracers to minimise modelling systematics

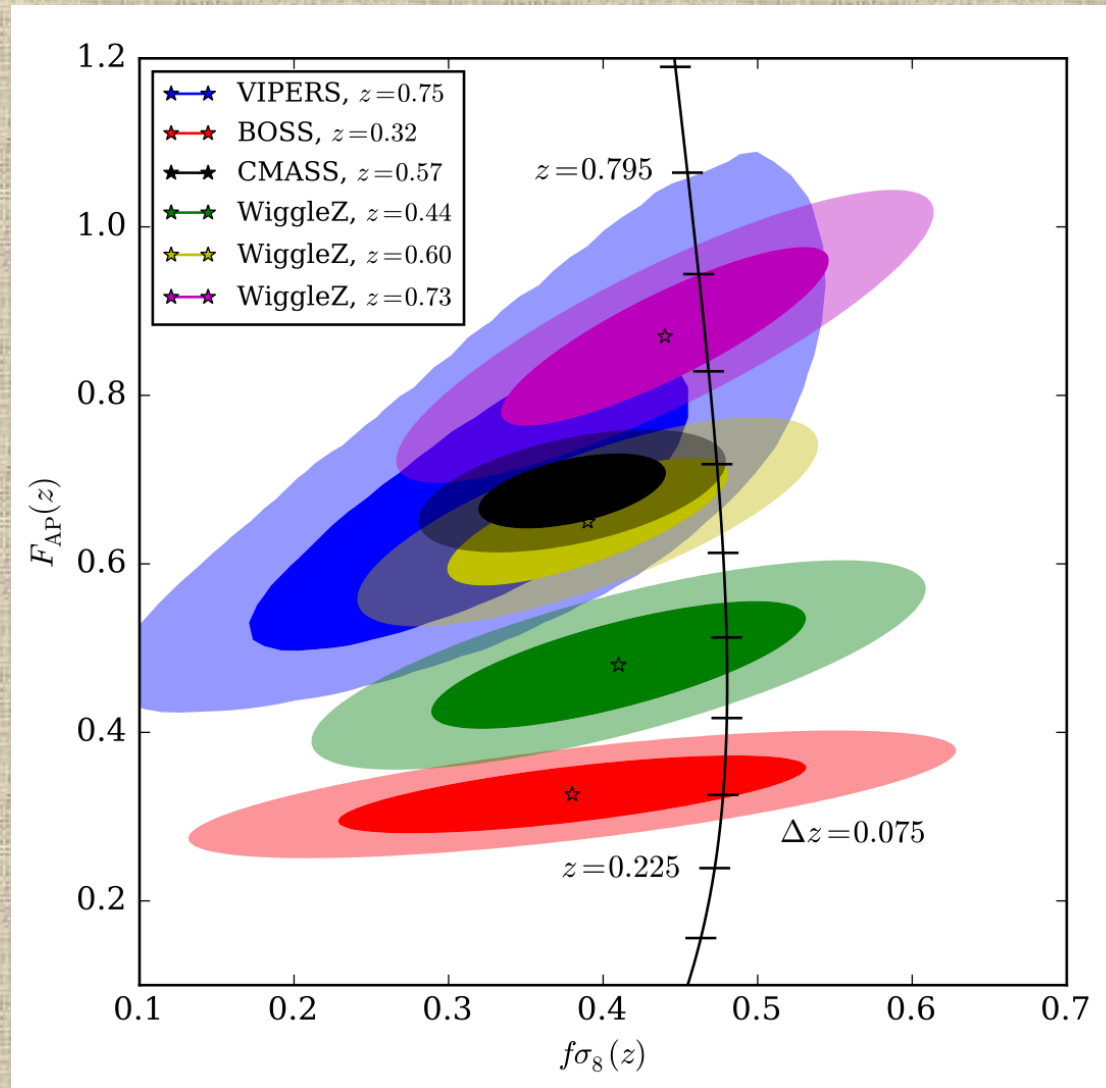
(Mohammad, Granett, Guzzo+ VIPERS, in preparation)



→ Blue luminous galaxies  
minimise weight of satellites

# RSD-AP simultaneous fit (from clipped density field)

(Wilson, Peacock + VIPERS, in preparation)



• **Preliminary: W1 field only**



# Use cosmic voids



3152

231.8

2922

2693

2463

2233

2004

148.5

0.0

-148.5

0.0

-231.8

0.53

0.60

0.67

0.75

0.83

0.92

$z$

$x$  (Mpc)

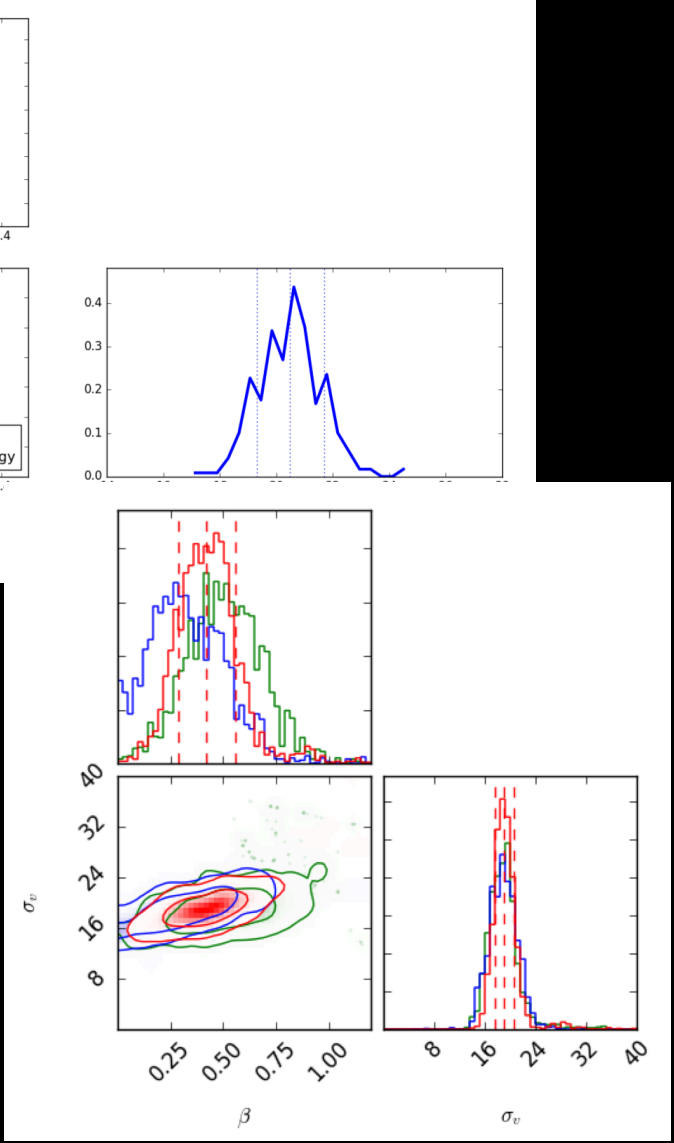
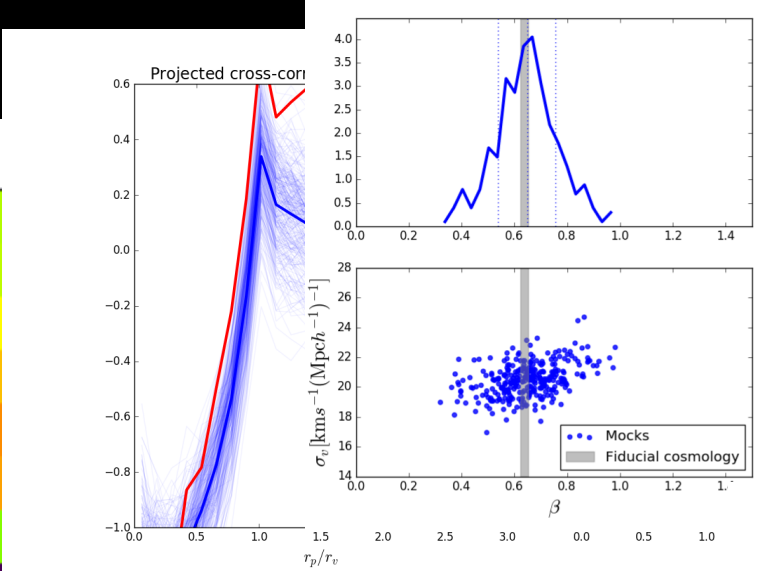
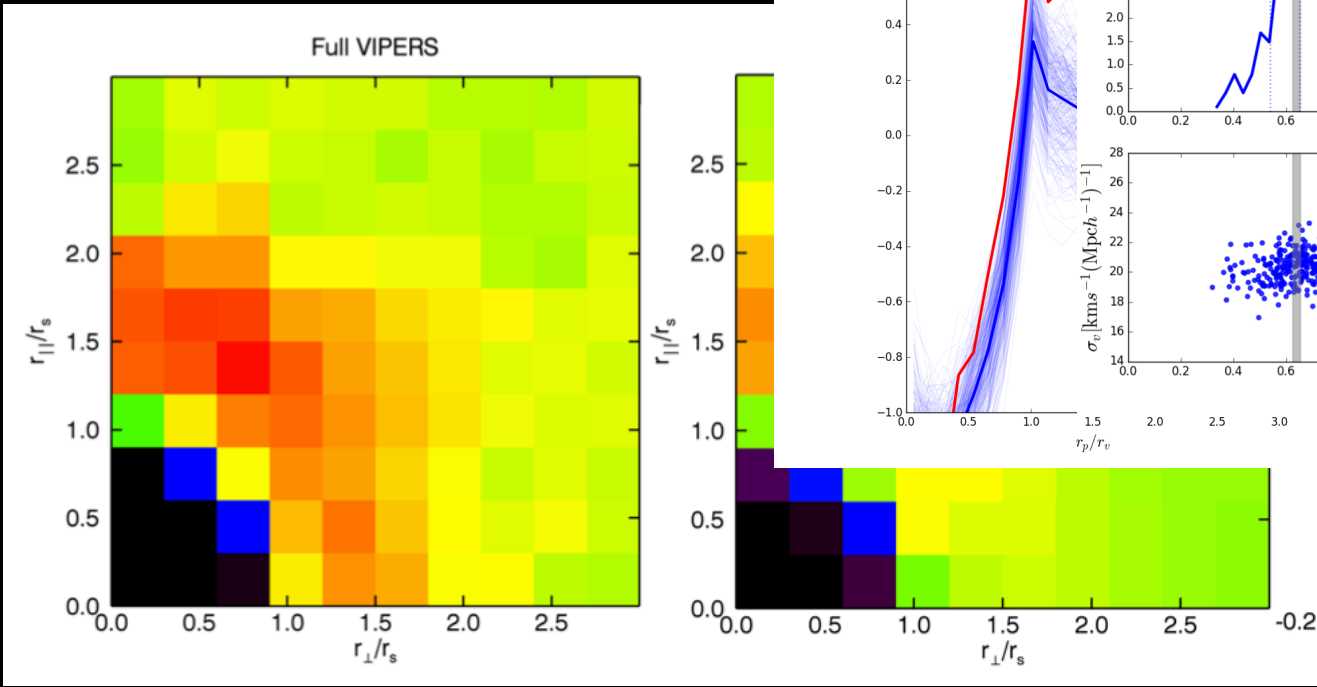
- Micheletti, Iovino+ 2015: void search and PDR-1 catalogue
- Hawken+2017: growth rate from galaxy outflows with PDR-2 void catalogue
- BOTH COSMOLOGY AND GALAXY EVOLUTION



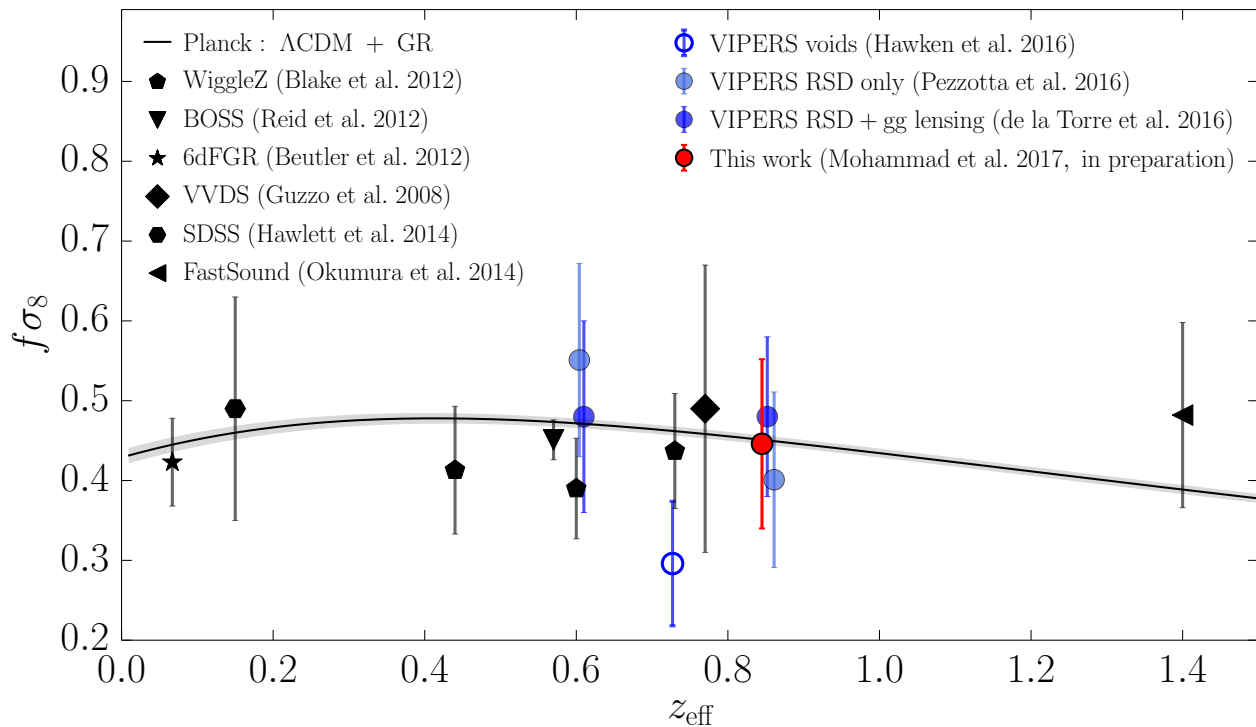
# Cosmic voids



Hawken+ 1611.07046



# Testing gravity with redshift-space distortions



- RSD in configuration space with accurate nonlinear modelling (de la Torre+ 2013; Pezzotta+ 2017)
- RSD & Galaxy-Galaxy lensing (de la Torre+ 2017)
- RSD around galaxy voids (Hawken+ arXiv:1611.07046)
- RSD in configuration space using sub-populations (Mohammad+ 2017)
- RSD from linearised density field in Fourier space (Wilson+ 2017)

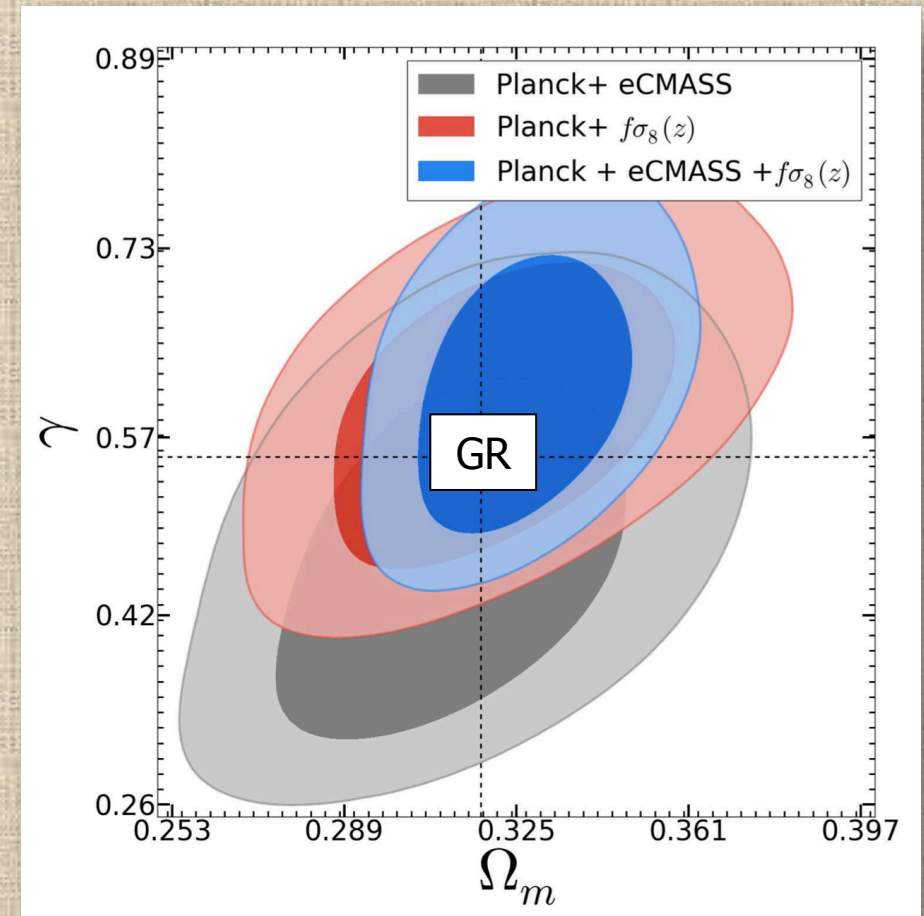
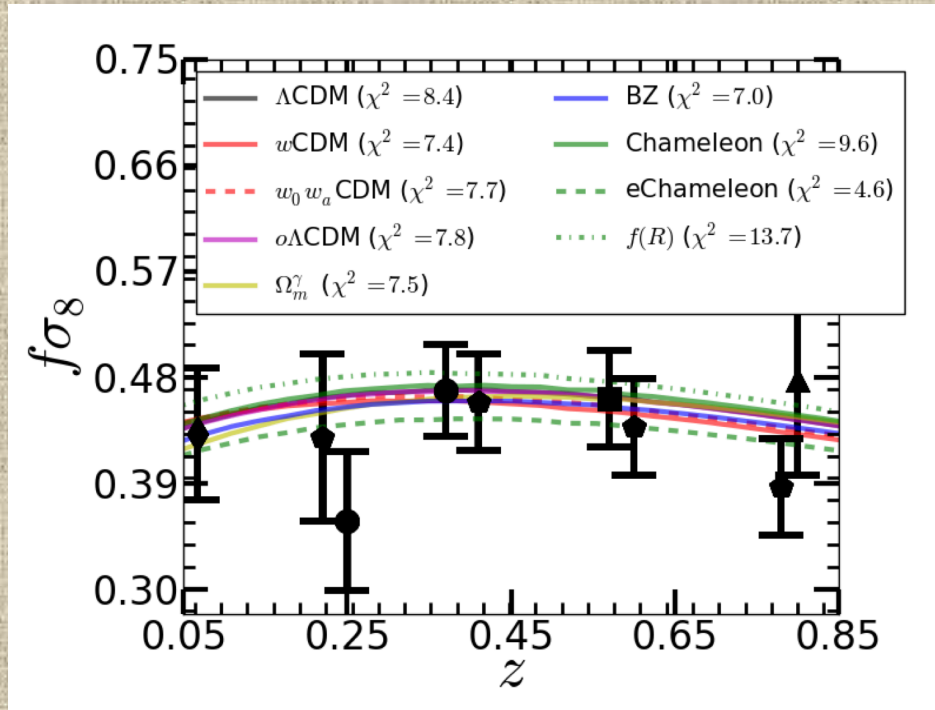
→ These different “angles” are made possible by unique combination of (a) large volume; (b) dense sampling; (c) broad selection function

VIPERS PDR-2 (Pezzotta+ 2017; de la Torre+ 2017; Hawken+ 2017; Mohammad+ 2017; Wilson 2017)



# Testing gravity with redshift-space distortions

(Alam, Ho & Silvestri 2016)



# The future: **do it all at once**, e.g. Wiener-filter reconstruction of the density field



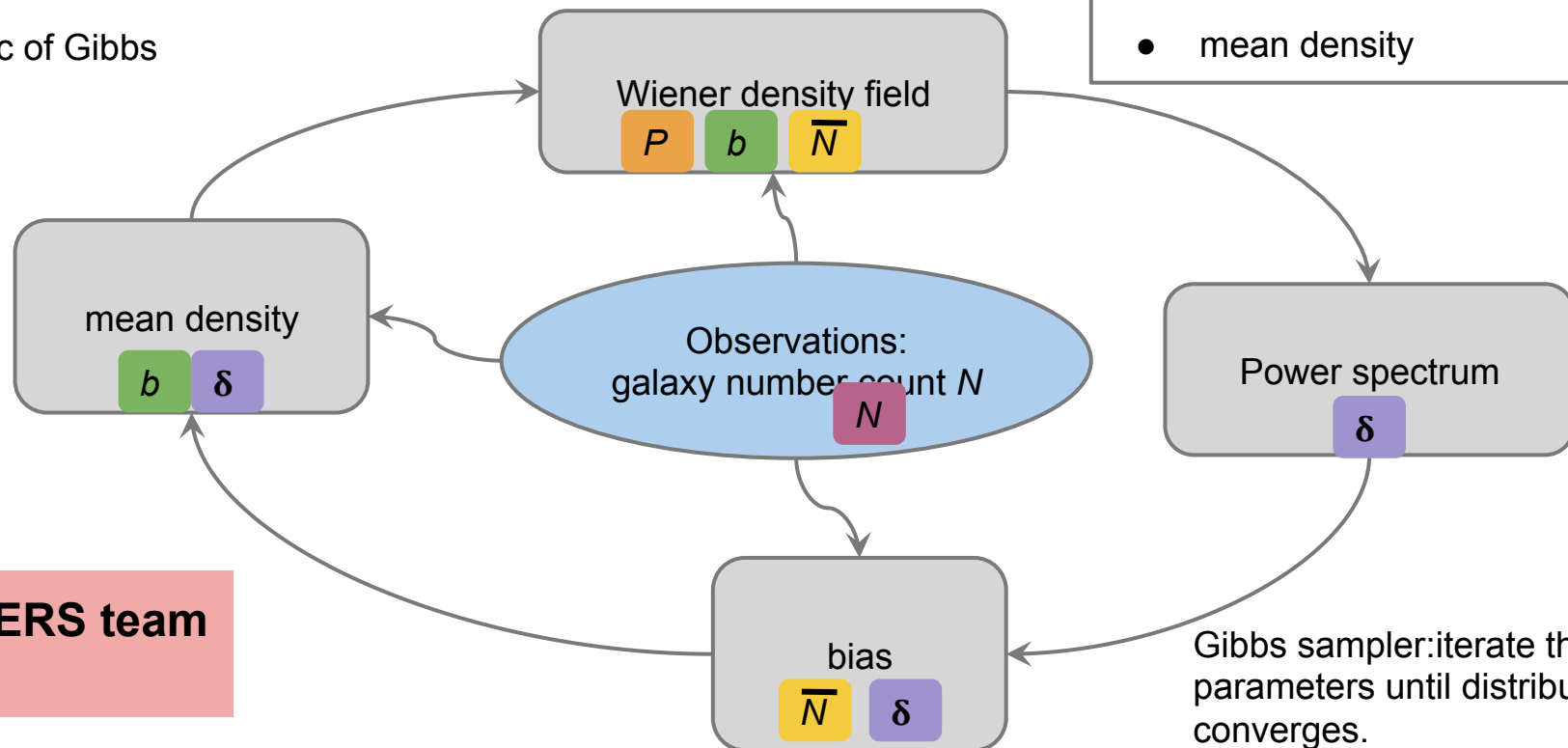
## Bayesian technique

- Markov Chain random walk through the parameter space gives the **joint posterior probability distribution** of the density field and galaxy statistics.

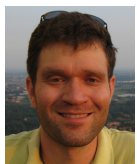
### Dependencies

- Wiener density field  $\delta$
- Power spectrum  $P$
- bias  $b$
- mean density  $\bar{N}$

Schematic of Gibbs sampler:

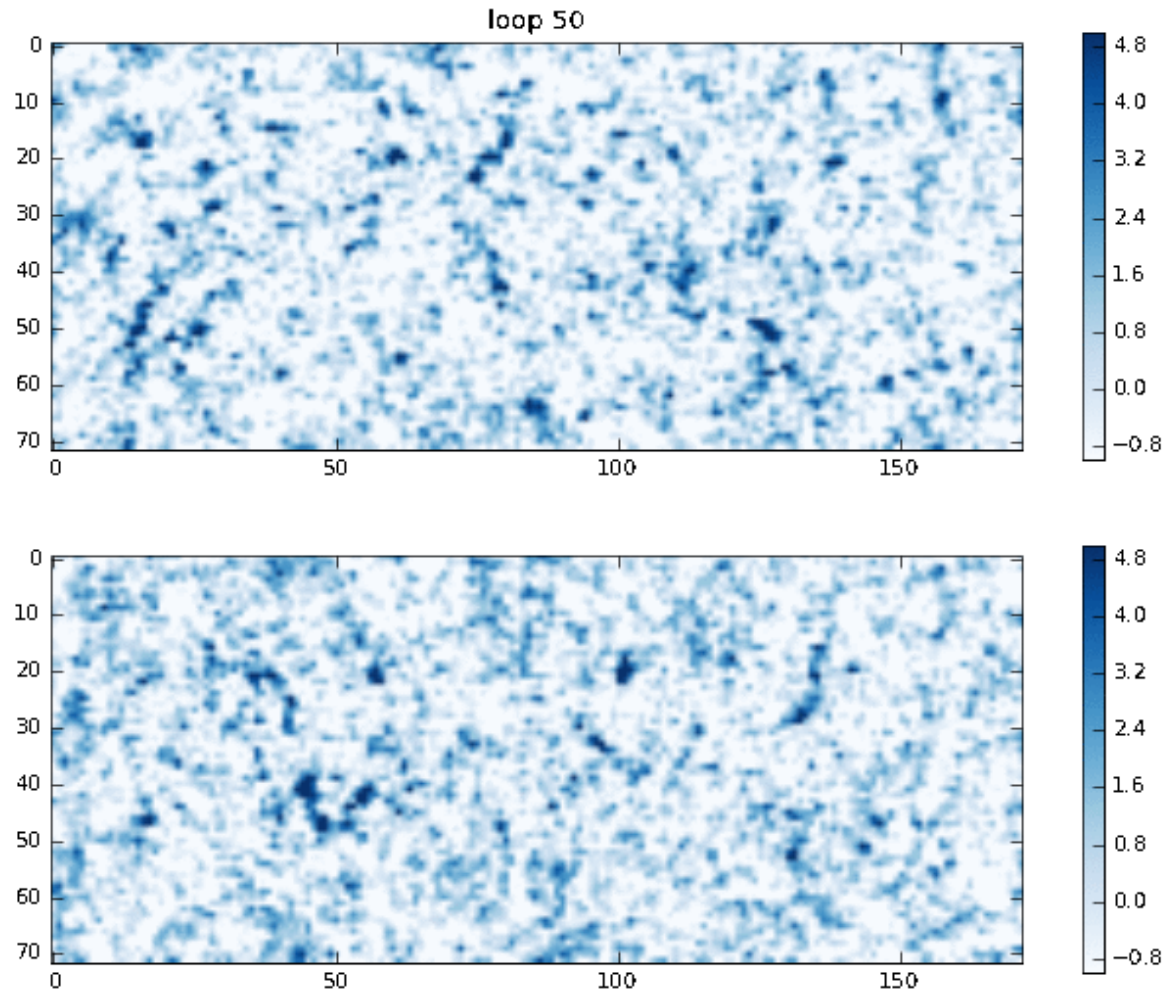


Gibbs sampler: iterate through parameters until distribution converges.



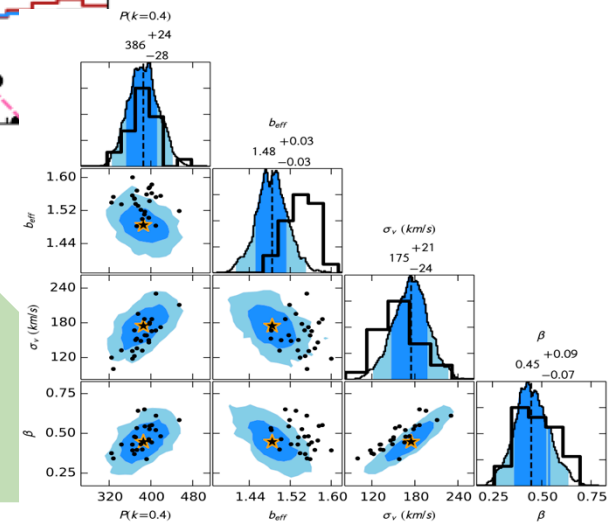
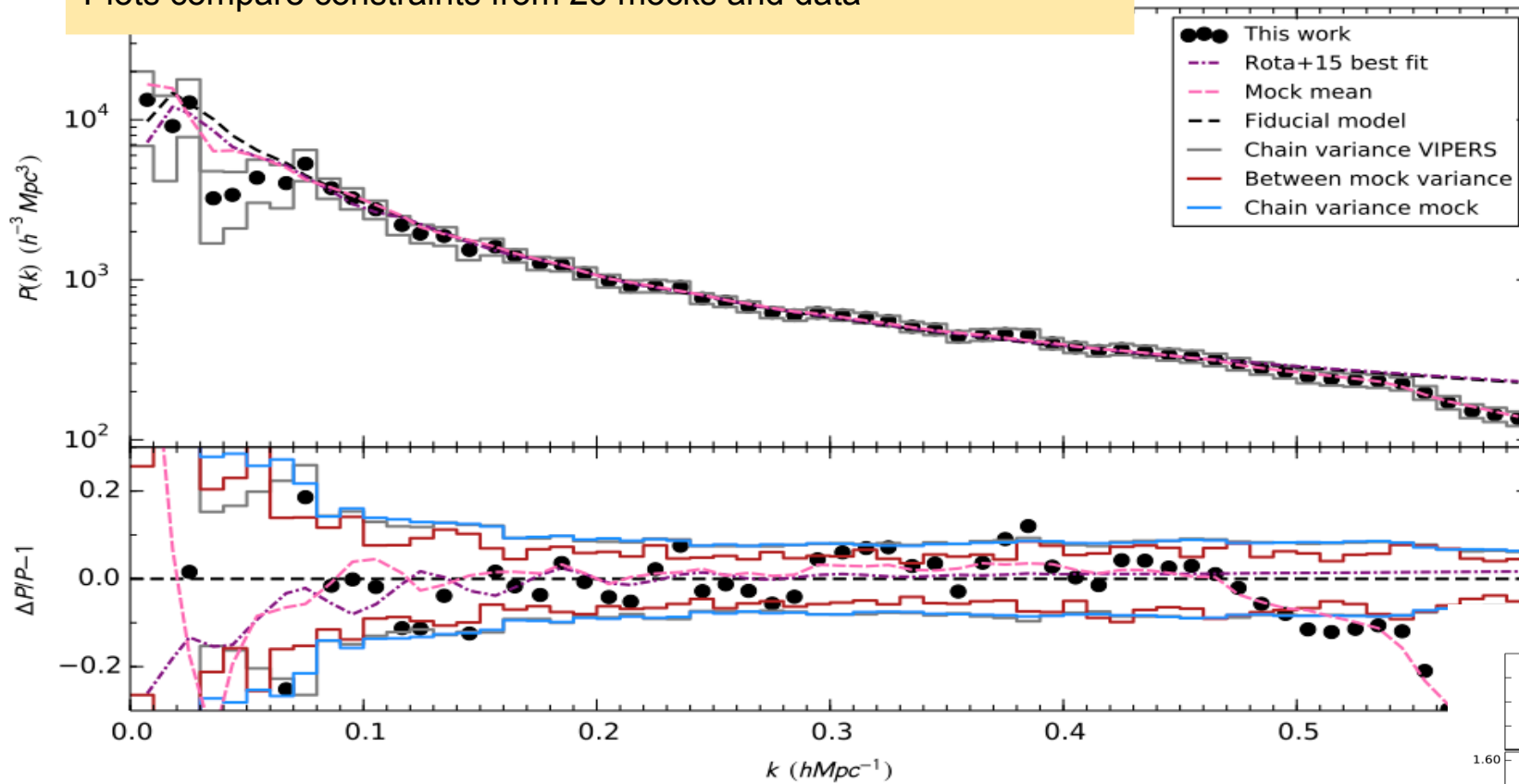
**Granett+VIPERS team**  
**1505.06337**

# Wiener-filter reconstruction of the density field



# Results: Power spectrum and RSD parameters

Plots compare constraints from 26 mocks and data

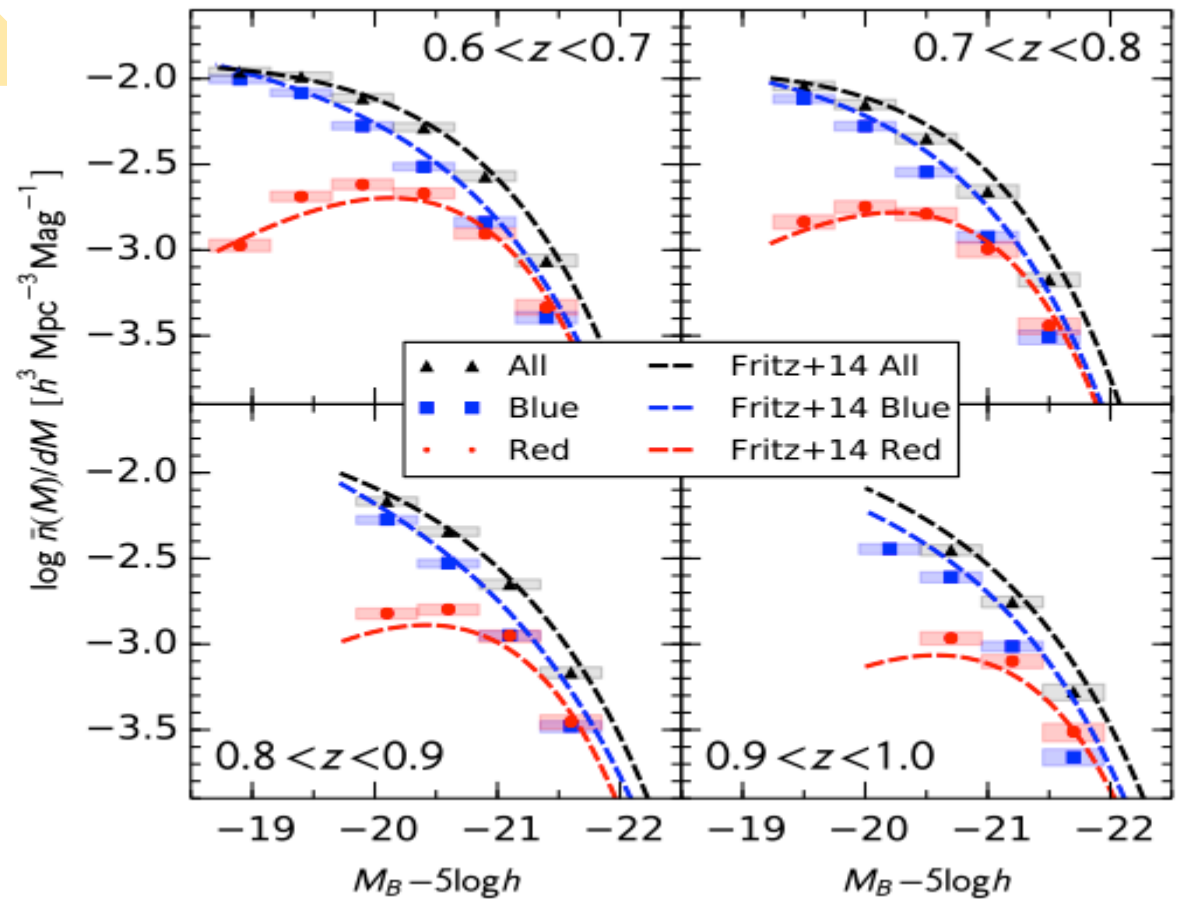


Granett+VIPERS team (2015)  
<http://arxiv.org/abs/1505.06337>

Recovered value for beta and growth rate are consistent with previous VIPERS analyses

## Results: number density and luminosity function

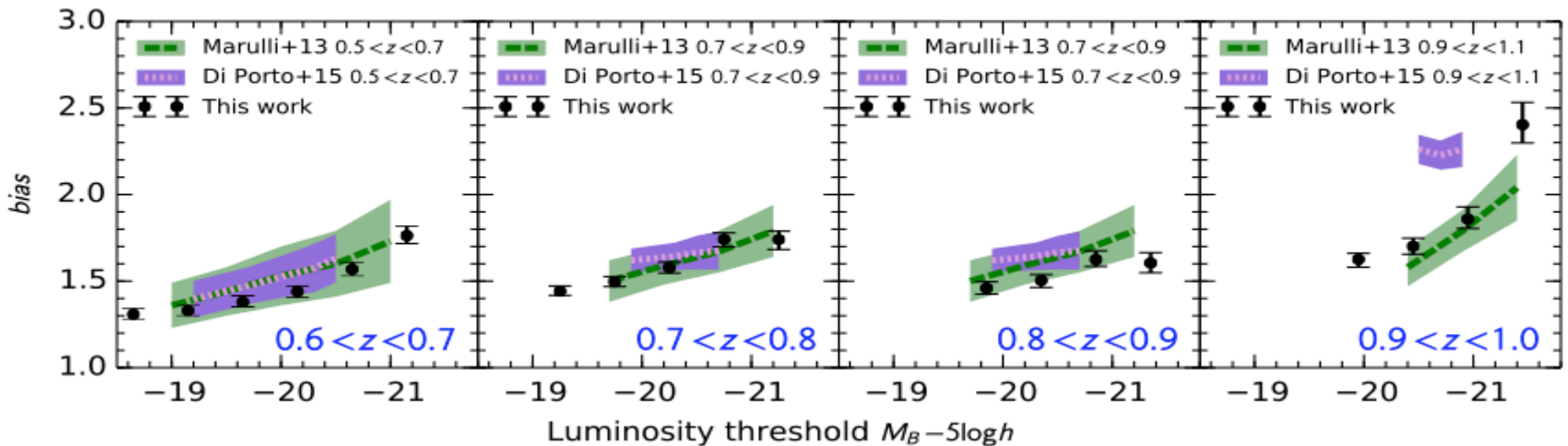
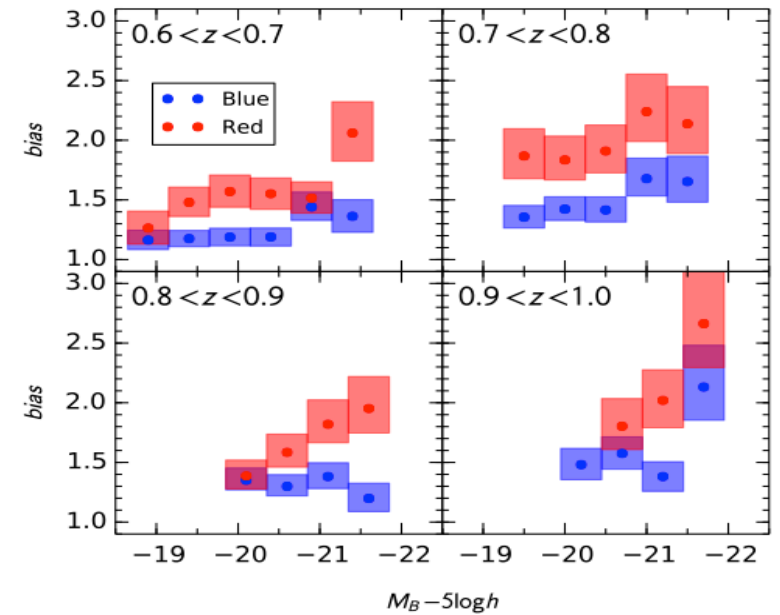
- Comparison of  $n(z,L)$  with Fritz et al
- Bayesian estimator accounts for correlations between galaxy bias and luminosity (a difference with STY estimator)





# Results: galaxy bias

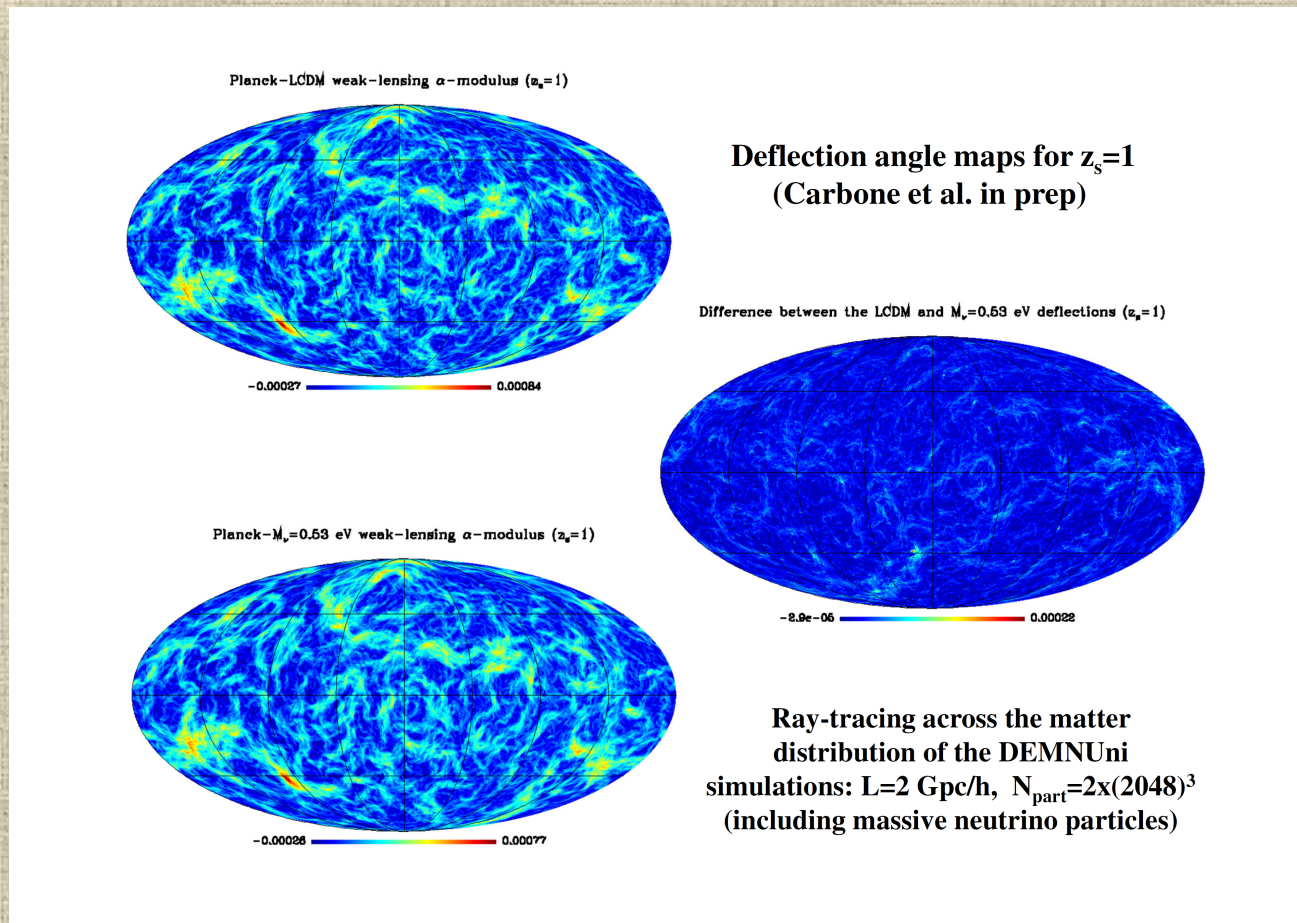
- *Color dependence shows red/blue bimodality*
- *Luminosity dependence in agreement with previous VIPERS analyses.*





# Caveats: (1) account for all existing (known) components: **neutrinos**

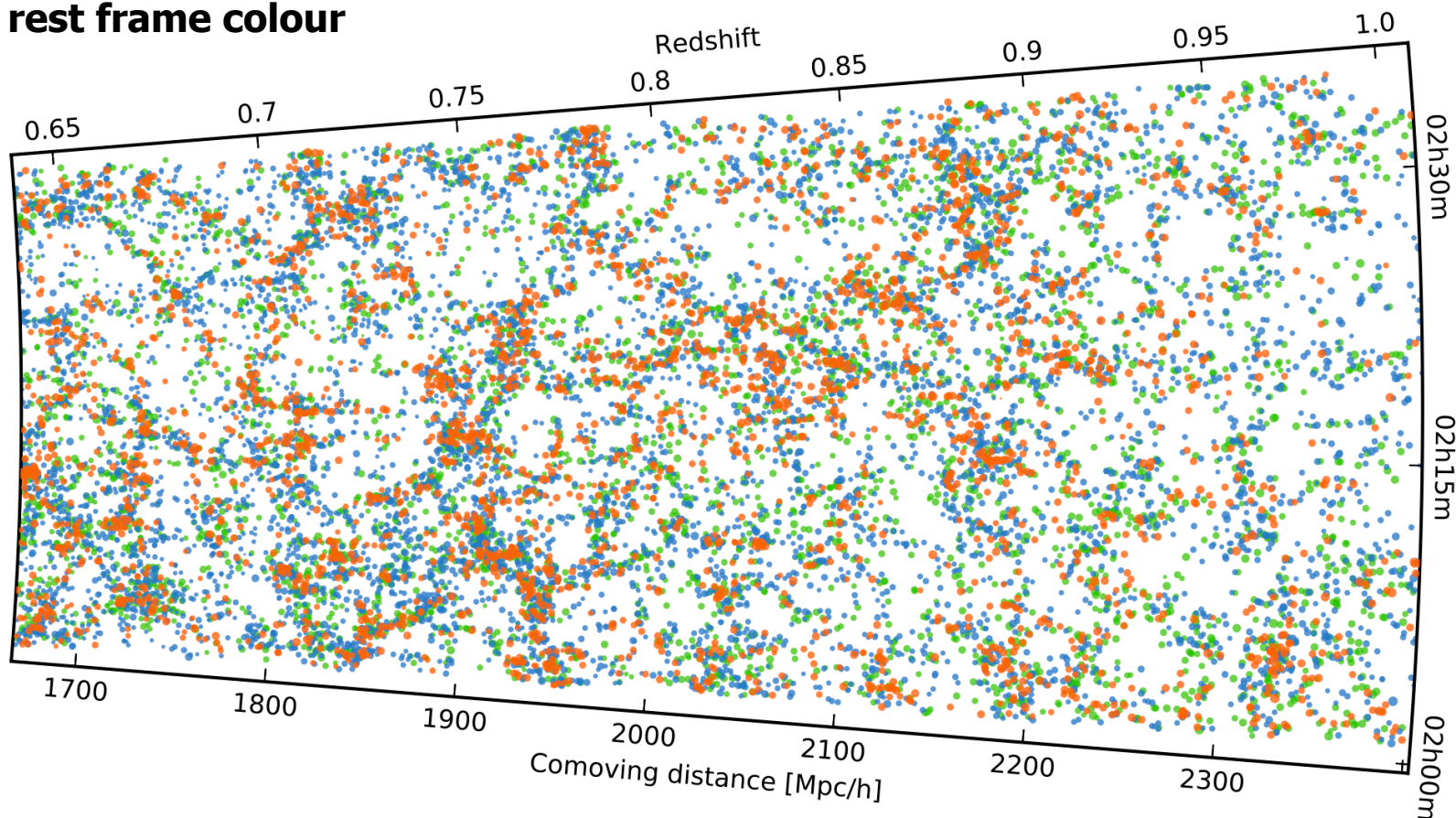
**Carbone et al., DEMNUni simulations**, largest existing n-body simulations including massive neutrino component (Carbone et al. 2016).  
Need particular care in setting initial conditions (Zennaro+ arXiv:1605.05283)



## Caveats: (2) Improve modelling and understanding of galaxies...



### VIPERS galaxies encoded using (U-B) rest frame colour

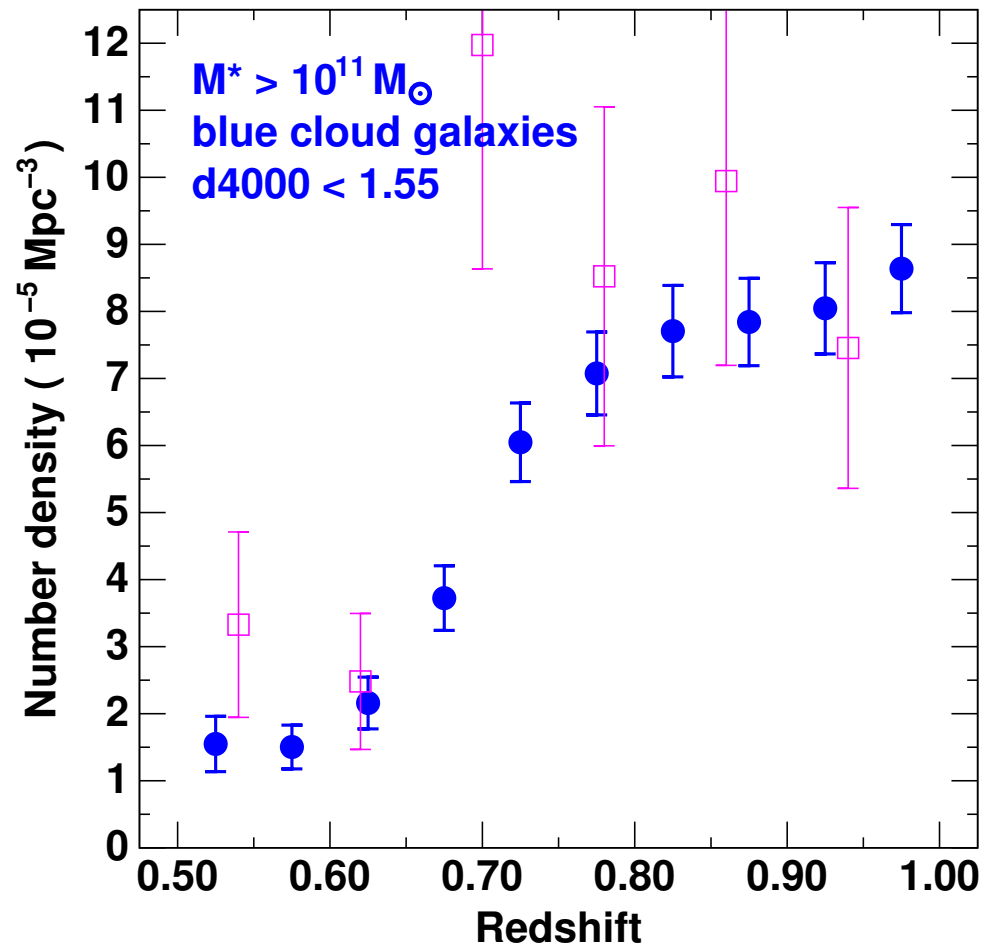


- **Understand galaxy formation in dark matter halos**
- **Understand *galaxy bias*: use galaxies properly to precisely infer cosmological parameters**

VIPERS traces the raise of star formation in massive objects back in time



Haines+ 1611.07050



**<n> of massive star-forming galaxies**

# Take home messages

**A brilliant future ahead for cosmology with galaxy surveys: by 2030 we'll have >50 million redshifts measured, over huge volumes down to  $z=2$  (Euclid, DESI, but also SKA, etc). This makes systematic errors the real limit**

## OBSERVATIONAL BIASES

- e.g. Low SNR slitless spectra (Euclid): confusion, completeness, purity → all these can be position dependent on the sky!
- Observational mask, uneven exposures, etc
- **Do not plan galaxy surveys just for cosmology! Leave door open for new techniques (e.g. voids, requiring high sampling), or selection of optimal sub-samples of galaxies**

## MODELLING

- How do my galaxy tracers sample the dark-matter distribution? DM-baryon connection (**bias**)
- We like it linear, however reality is **non-linear** if we want to maximise signal
- We work in **redshift space**: we have turned this to our advantage, yet need to keep improving RSD models (e.g. de la Torre & Guzzo 2012, Bianchi et al. 2014, 2016)
- **Modelling is easier if we choose the right galaxy population (Mohammad+ 2017)**
- We are working at 1% precision. Need to include all ingredients → **neutrinos!** (e.g. Carbone+ 2017)

