

Joint analysis of galaxy clustering and galaxy-galaxy lensing

Astronomy & Astrophysics manuscript no. rsdlens
August 29, 2017

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The VIMOS Public Extragalactic Redshift Survey (VIPERS)[★]

Gravity test from the combination of redshift-space distortions and galaxy-galaxy lensing at $0.5 < z < 1.2$

LAM

S. de la Torre¹, E. Jullo¹, C. Giocoli¹, A. Pezzotta^{2,3}, J. Bel⁴, B. R. Granett², L. Guzzo^{2,5}, B. Garilli⁶, M. Scodreggio⁶, M. Bolzonella⁷, U. Abbas⁸, C. Adami¹, D. Bottini⁶, A. Cappi^{7,9}, O. Cucciati^{10,7}, I. Davidzon^{1,7}, P. Franzetti⁶, A. Fritz⁶, A. Iovino², J. Krywult¹¹, V. Le Brun¹, O. Le Fèvre¹, D. Maccagni⁶, K. Małek¹², F. Marulli^{10,13,7}, M. Polletta^{6,14,15}, A. Pollo^{12,16}, L.A.M. Tasca¹, R. Tojeiro¹⁷, D. Vergani¹⁸, A. Zanichelli¹⁹, S. Arnouts¹, E. Branchini^{20,21,22}, J. Coupon²³, G. De Lucia²⁴, O. Ilbert¹, T. Moutard^{25,1}, L. Moscardini^{10,13,7}, J. A. Peacock²⁶, R. B. Metcalf¹⁰, F. Prada^{27,28,29}, and G. Yepes³⁰

(Affiliations can be found after the references)

August 29, 2017

 [arXiv:1612.05647](https://arxiv.org/abs/1612.05647)

Outline

I) Motivations for GC + GL

1a Galaxy clustering (GC)

1b Galaxy lensing (GL)

II) Methodology

2a Galaxy clustering

2b Galaxy lensing

2c Lightcone mocks

2d Covariance matrix

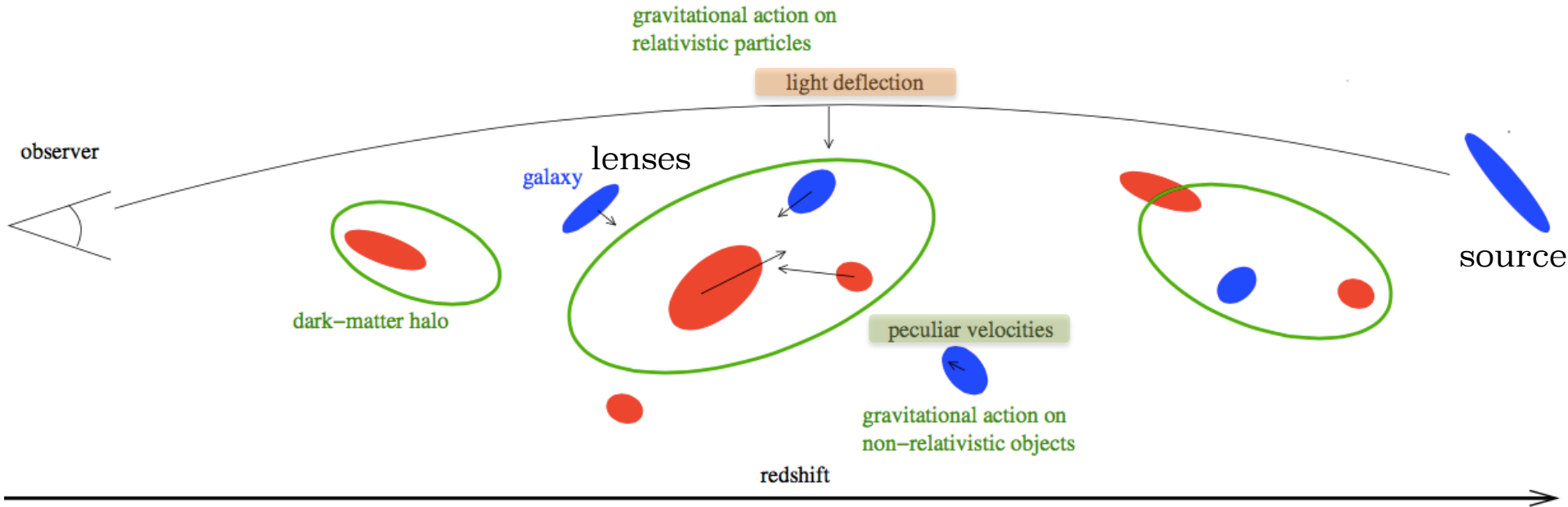
III) Joint analysis

4a Joint likelihood

4b Tests

IV) Cosmological results

Motivations for GC + GL



Plot from Martin Kilbinger @Euclid Summer school 2017

$$ds^2 = -(1 + 2\varphi)dt^2 + (1 - 2\phi)a^2 dx^2$$

Matter gravitational potential

Galaxy clustering (GC)

→ Measures φ

→ $f\sigma_8$ and $b\sigma_8$

Light gravitational potential

Galaxy lensing (GL)

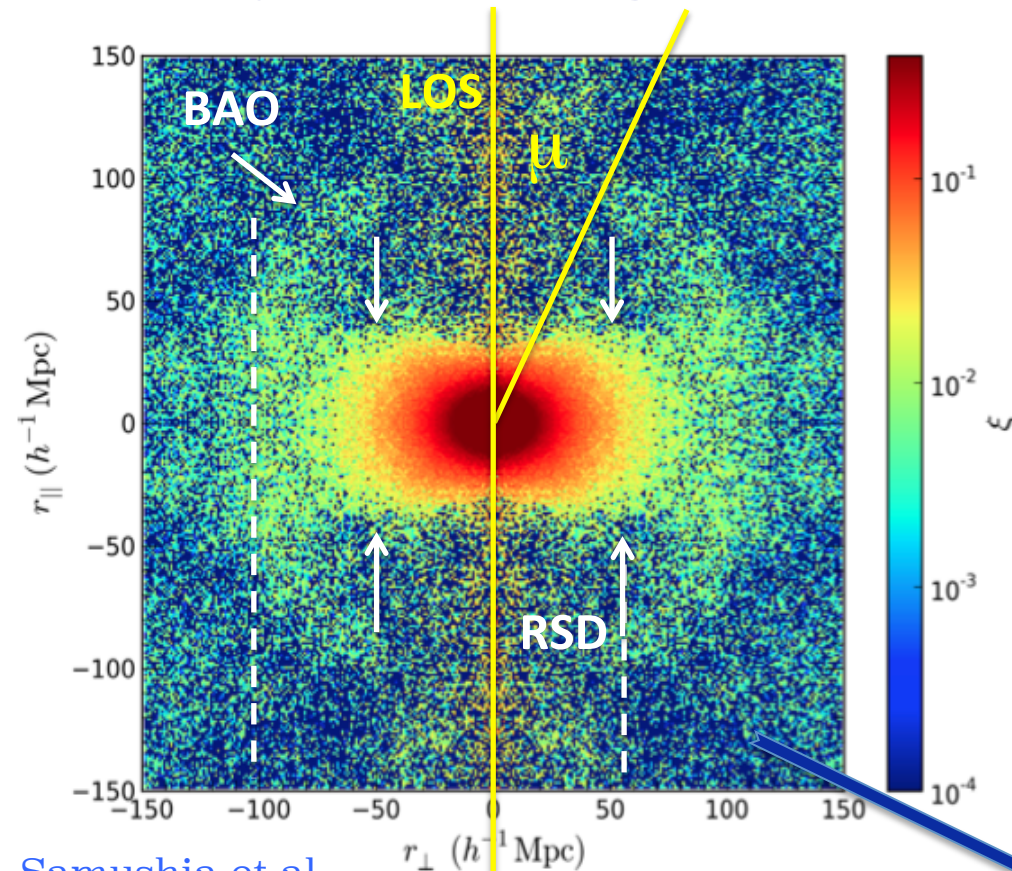
→ Measures $\varphi + \phi$

→ Measures b and σ_8

Note: in General Relativity $\varphi = \phi$

Motivations for GC + GL

Galaxy clustering (GC)



2-point correlation function

$$\xi(r) = \langle \delta(\mathbf{x})\delta(\mathbf{x} + \mathbf{r}) \rangle$$

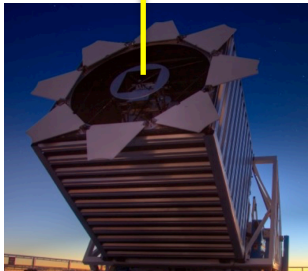
2 main observational features

- At very large scales ($\sim 100 h^{-1}\text{Mpc}$): Baryon Acoustic Oscillations
- At intermediate scales ($\sim 50 h^{-1}\text{Mpc}$): Redshift Space Distortions

Legendre multipoles with ξ_0, ξ_2

$$\xi_l(s) = \frac{2l+1}{2} \sum_j \xi(s, \mu_j) P_l(\mu_j) d\mu$$

Samushia et al.
(2014)



Clustering analysis

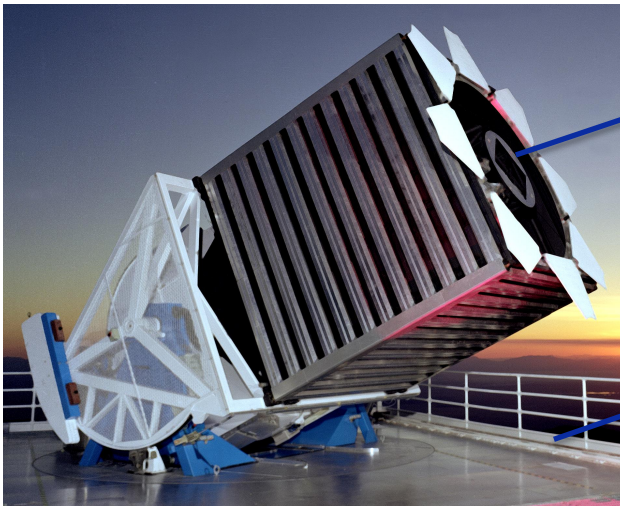
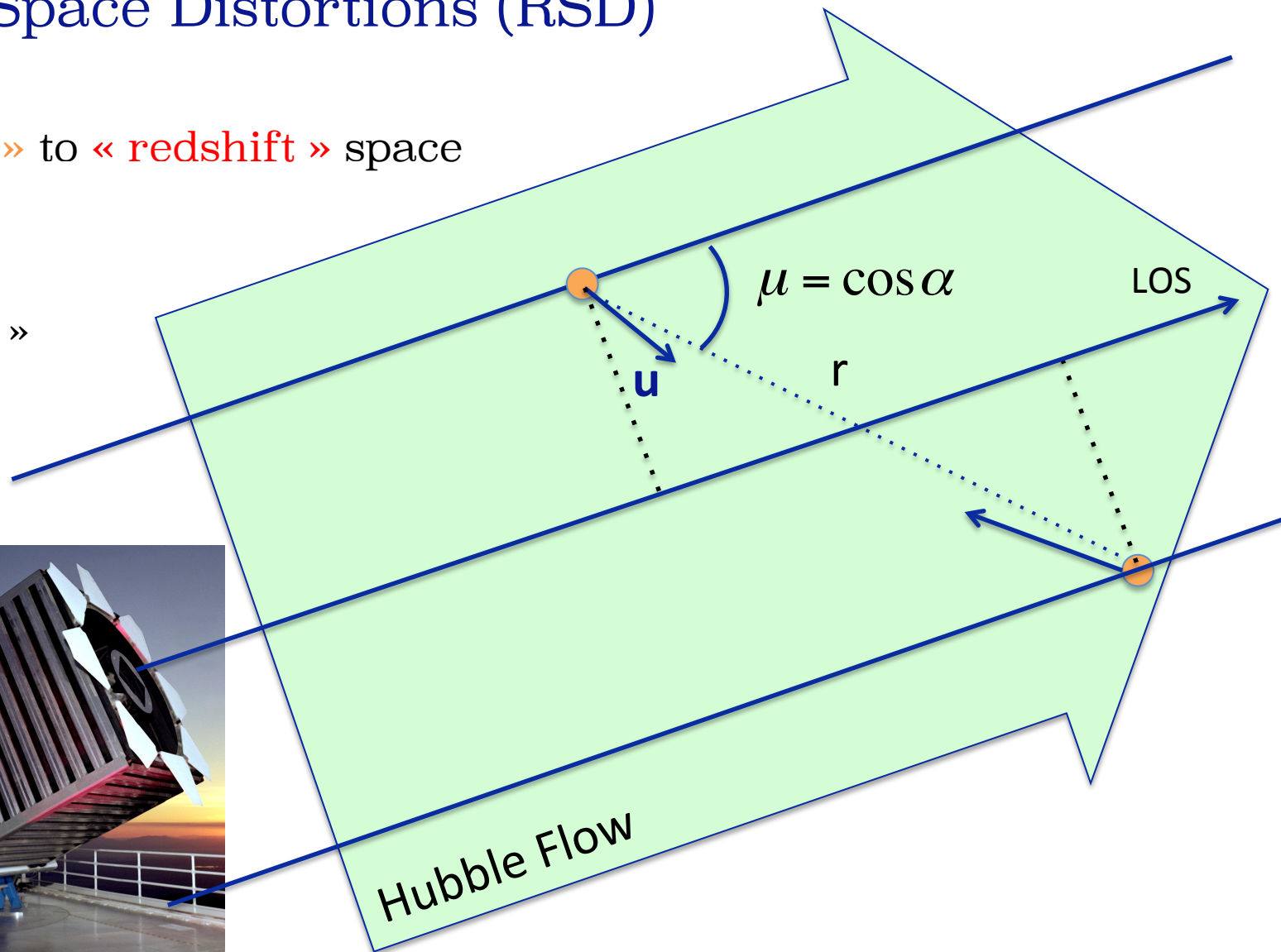
Redshift Space Distortions (RSD)

From « real » to « redshift » space

$$\mathbf{s} = \mathbf{r}$$



« Hubble flow »
displacement



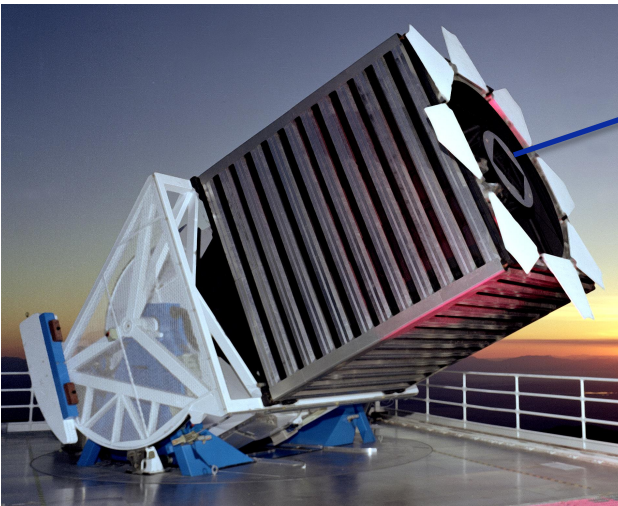
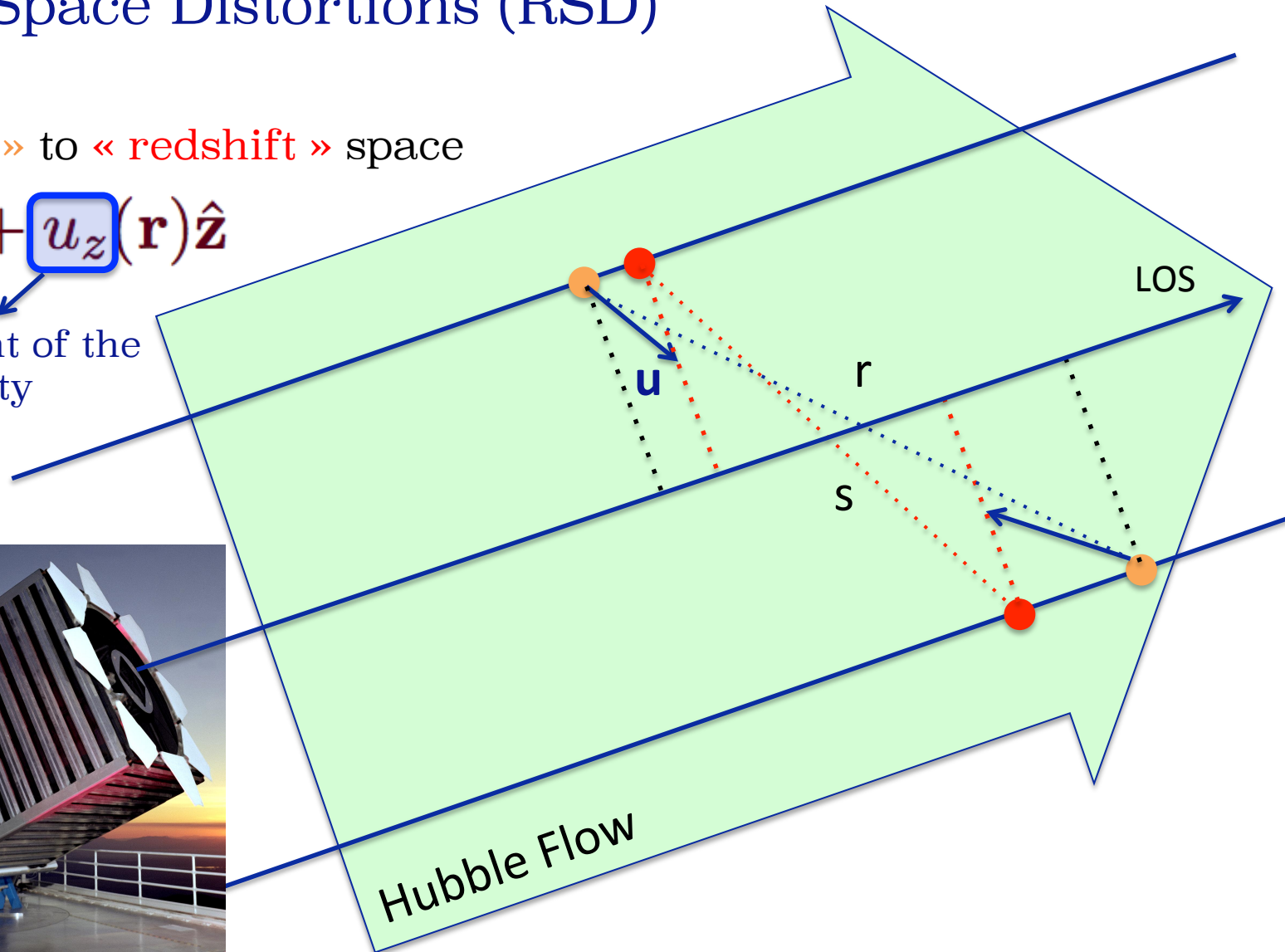
Clustering analysis

Redshift Space Distortions (RSD)

From « real » to « redshift » space

$$\mathbf{s} = \mathbf{r} + u_z(\mathbf{r})\hat{\mathbf{z}}$$

LOS component of the peculiar velocity



Clustering analysis

RSD as a probe for structure growth

Real-to-redshift space mapping

Position in **redshift space**

$$\mathbf{s} = \mathbf{r} + u_z(\mathbf{r}) \hat{\mathbf{z}}$$

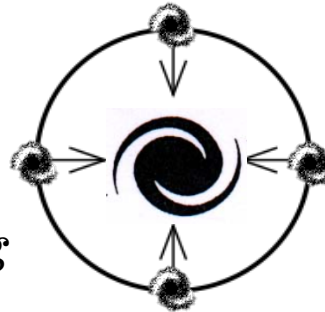
Position in **real space**

Sensitive to the **growth rate**
 → direct prediction of GR

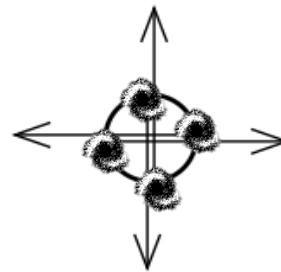
$$f(a) = \Omega_m(a)^{\gamma=0.55}$$

$$1 + z = \frac{\lambda}{\lambda_0} = \frac{a_0}{a(t)} \text{ Scale factor}$$

Real space:

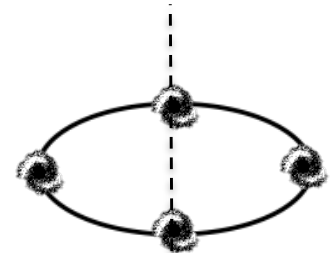


Linear regime

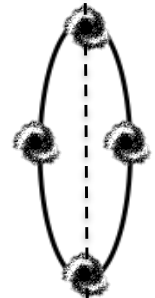


Collapsing

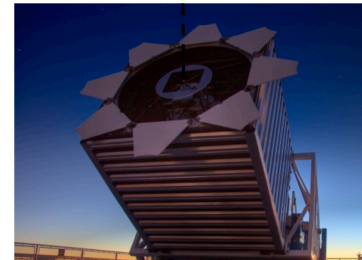
Redshift space:



Squashing effect



Finger-of-god

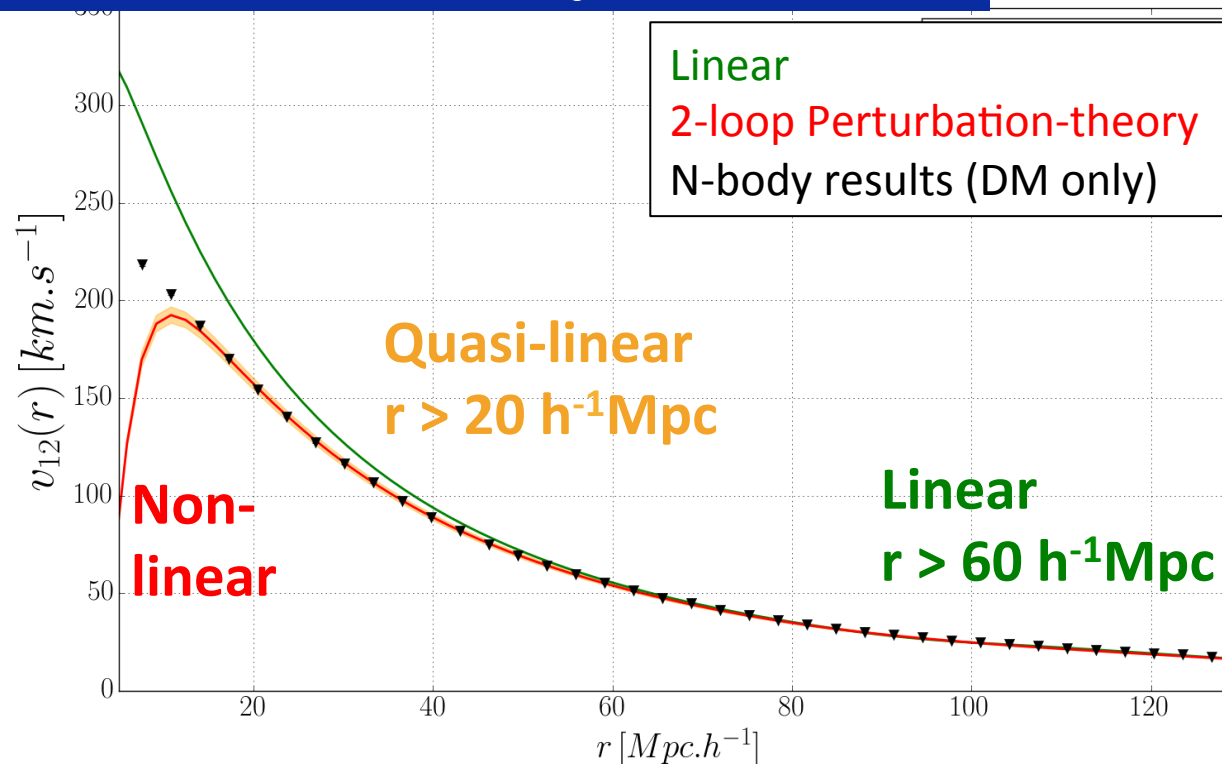


Clustering analysis

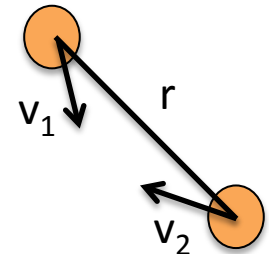
Full-shape modeling

I) Real-to-redshift space mapping

II) Perturbation theory for δ and v



Infall velocity



$$v_{12}(r) = (\mathbf{v}_2 - \mathbf{v}_1) \cdot \mathbf{r} / |\mathbf{r}|$$

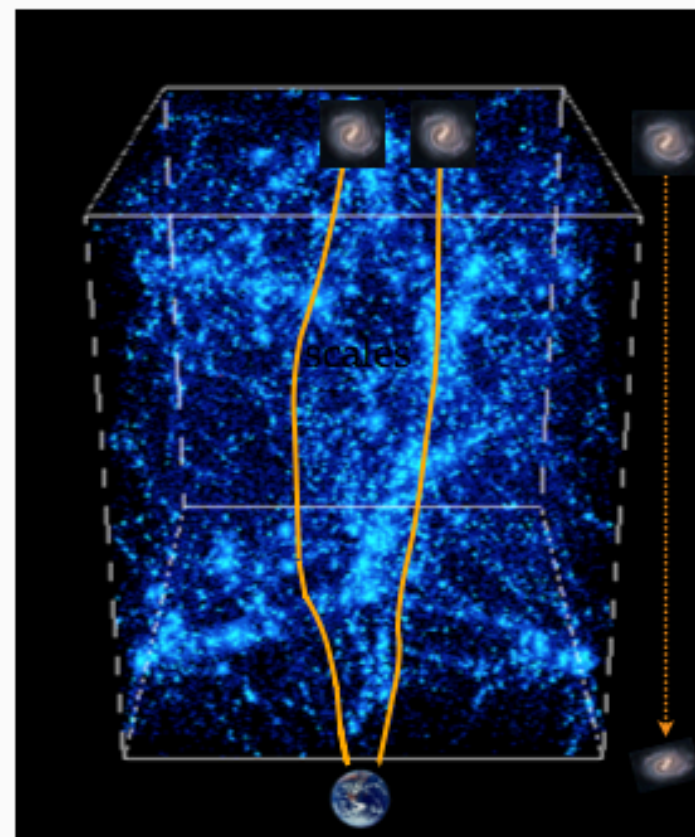
III) Bias modeling: halos \rightarrow galaxies

Motivations for GC + GL

Galaxy lensing (GL)

Light of distant galaxies is deflected while travelling through inhomogeneous Universe. Information about mass distribution is imprinted on observed galaxy images.

- Continuous deflection: sensitive to projected 2D mass distribution.
- Differential deflection: magnification, distortions of images.
- Small distortions, few percent change of images: need statistical measurement.
- Coherent distortions: measure correlations, scales few Mpc to few 100 Mpc.



Slide from Martin Kilbinger @Euclid Summer school 2017

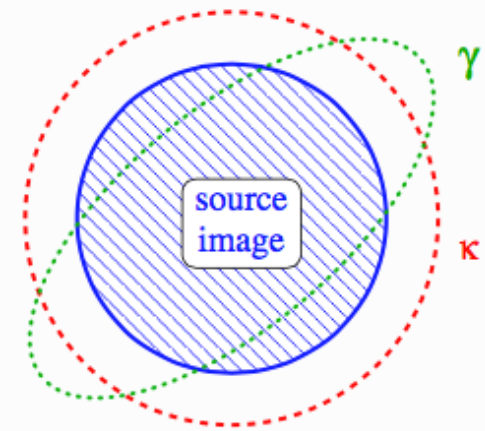
Weak lensing analysis

Convergence and shear

- **convergence** κ : isotropic magnification $\frac{\partial\beta_i}{\partial\theta_j} \equiv A_{ij} = \delta_{ij} - \partial_i\partial_j\psi$.
- **shear** γ : anisotropic stretching

Jacobi (symmetric) matrix

$$A = \begin{pmatrix} 1 - \kappa - \gamma_1 & -\gamma_2 \\ -\gamma_2 & 1 - \kappa + \gamma_1 \end{pmatrix}$$



Weak lensing regime

$$\kappa \ll 1, |\gamma| \ll 1.$$

The **observed ellipticity** of a galaxy is the sum of the intrinsic ellipticity and the shear:

$$\varepsilon^{\text{obs}} \approx \varepsilon^{\text{s}} + \gamma$$

Random intrinsic orientation of galaxies

$$\langle \varepsilon^{\text{s}} \rangle = 0 \quad \longrightarrow \quad \langle \varepsilon \rangle = \gamma$$

The observed ellipticity is an unbiased estimator of the shear. Very noisy though! $\sigma_\varepsilon = \langle |\varepsilon^{\text{s}}|^2 \rangle^{1/2} \approx 0.4 \gg \gamma \sim 0.03$. Increase S/N and beat down noise by averaging over large number of galaxies.

Adapted slide from Martin Kilbinger @Euclid Summer school 2017

Weak lensing analysis

Shear measurement challenges

- Cosmological shear $\gamma \ll \varepsilon$ intrinsic ellipticity
- Galaxy images corrupted by PSF
- Measured shapes are biased

Characterisation

Bias can be multiplicative (m) and additive (c):

$$\gamma_i^{\text{obs}} = (1 + m_i)\gamma_i^{\text{true}} + c_i; \quad i = 1, 2.$$

Biases m , c are typically complicated functions of galaxy properties (e.g. size, magnitude, ellipticity), redshift, PSF, ... They can be scale-dependent.

Current methods: $|m| = 1\% - 10\%$, $|c| = 10^{-3} - 10^{-2}$.

year	program	m	c	$\sigma(c)$
2006	STEP I	0.1		10^{-3}
2012	CFHTLenS	0.06	0.002	
2013	great3	0.01	10^{-3}	
2014	DES	0.03–0.04	10^{-3}	
2016	KiDS	0.01–0.02	$8 \cdot 10^{-4}$	
2021	Euclid required	$2 \cdot 10^{-3}$	$5 \cdot 10^{-4}$	

Adapted slide from Martin Kilbinger @Euclid Summer school 2017

Motivations for GC + GL

Galaxy clustering (GC)

Application to VIPERS final data:

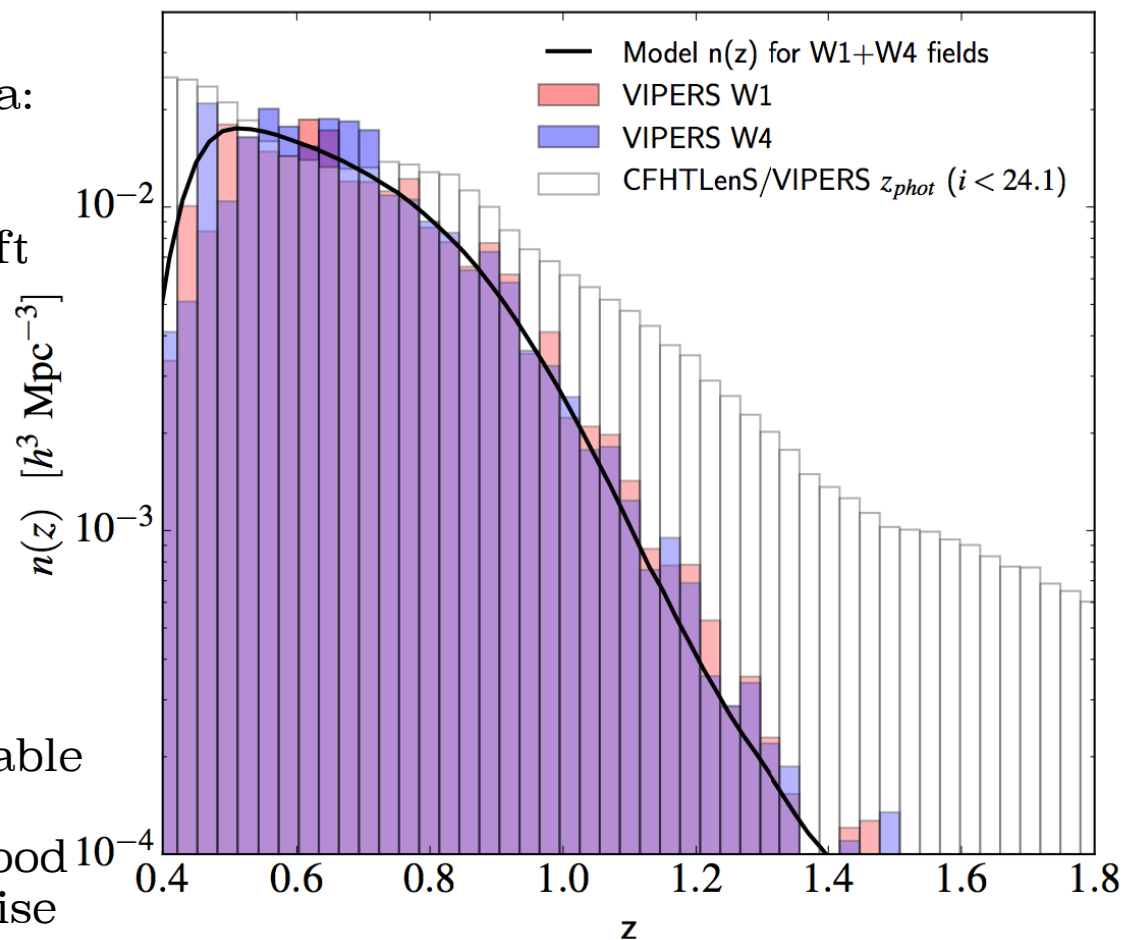
- VIPERS selection $i_{AB} < 22.5$
- Effective area of 23.5 deg^2
- 76584 galaxies with a redshift confidence level $> 96\%$



Galaxy lensing (GL)

Application to CFHTLenS:

- VIPERS selection $i_{AB} < 22.5$
- VIPERS redshifts when available (30% objects)
- CFHTLenS maximum likelihood photometric redshifts otherwise



de la Torre et al. 2017

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4a Joint likelihood

4b Tests

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Methodology

Galaxy clustering

I) Real-to-redshift space mapping

(TNS, Taruya et al. 2010)

$$P^S(k, \nu) = D(kv\sigma_\nu) \left[P_{\delta\delta}(k) + 2\nu^2 f P_{\delta\theta}(k) + \nu^4 f^2 P_{\theta\theta}(k) + C_A(k, \nu, f) + C_B(k, \nu, f) \right],$$

~~II) Perturbation theory for δ and ν~~

(HALOFIT, Smith et al. 2003)

$P_{\delta\delta}$ using the latest calibration of HALOFIT, [Takahashi et al. 2012](#))

$$P_{\theta\theta}(z) = P_{\text{lin}}(z) e^{-km_1\sigma_8^{m_2}(z)}$$

Fitting functions of [Bel et al. 2017](#)

$$P_{\delta\theta}(z) = \left(P_{\delta\delta}(z) P_{\text{lin}}(z) e^{-kn_1\sigma_8^{n_2}(z)} \right)^{1/2}$$

III) Bias modeling: halos \rightarrow galaxies

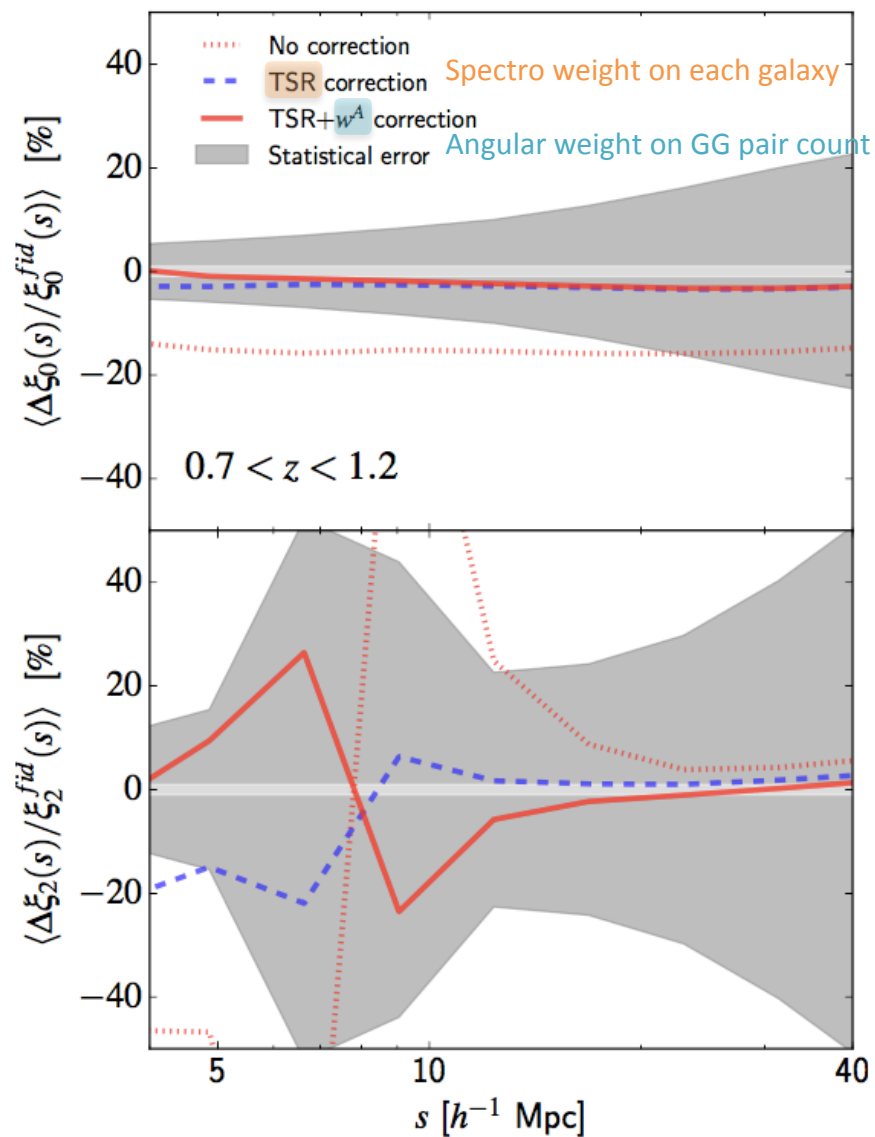
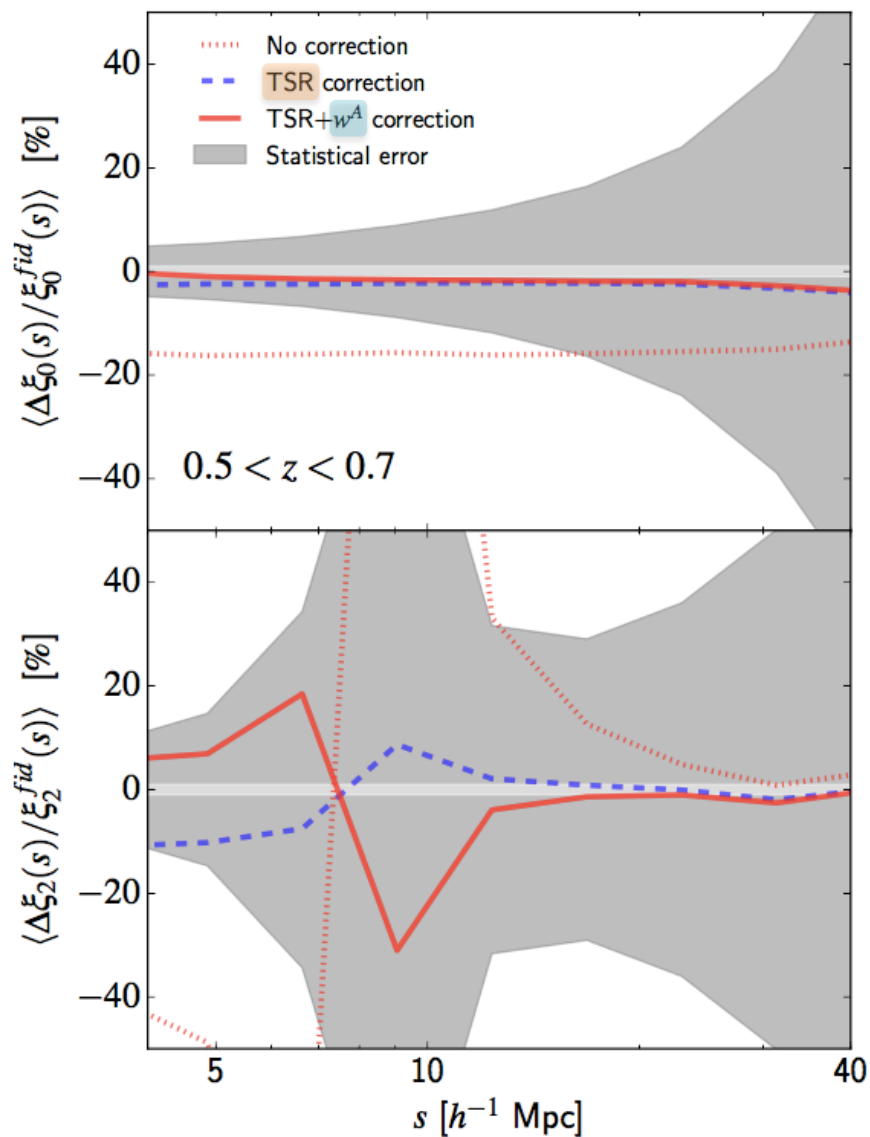
(Non-linear non local bias model, [McDonald & Roy 2009](#))

$$\delta_g(\mathbf{x}) = b_1\delta(\mathbf{x}) + \frac{1}{2}b_2[\delta^2(\mathbf{x}) - \sigma^2] + \frac{1}{2}b_{s^2}[s^2(\mathbf{x}) - \langle s^2 \rangle]$$

Methodology

Galaxy clustering

de la Torre et al. 2017



Methodology

Galaxy lensing

Ellipticity

$$\varepsilon^{\text{obs}} \approx \varepsilon^{\text{s}} + \gamma$$

stack $\rightarrow \langle \varepsilon^{\text{s}} \rangle = 0$

Observable: differential excess surface density

$$\Delta \Sigma_{\text{gm}}(r_p) = \frac{\sum_{i=1}^{N_S} \sum_{j=1}^{N_L} w_i^S e_{t,i} \langle \Sigma_{\text{crit}, ij}^{-1} \rangle \Theta_{ij}(r_p)}{\sum_{i=1}^{N_S} \sum_{j=1}^{N_L} w_i^S \langle \Sigma_{\text{crit}, ij}^{-1} \rangle^2 \Theta_{ij}(r_p)}$$

Inverse-variance weight to downweight pairs at close z (average over the source redshift PDF)

related to Ω_m and ξ_{gm}

Weight to account for biases in the determination of ellipticities (using simulations)

$$\langle \Sigma_{\text{crit}}^{-1} \rangle = \int_{z_L}^{\infty} dz_S p_s(z_S) \Sigma_{\text{crit}}^{-1}(z_L, z_S) \quad \text{source redshift probability distribution function } p_s$$

$$\Sigma_{\text{crit}} = \frac{c^2}{4\pi G} \frac{D_S}{D_{\text{LS}} D_L}$$

In the above equations, r_p is the comoving transverse distance between lens and source galaxies, D_S , D_{LS} , D_L are the angular diameter observer-source, lens-source, and observer-lens distances, and c is the speed of light in the vacuum.

- **Estimator 1:** using $\Sigma_{\text{crit}, ij}^{-1}$
- **Estimator 2:** using $\langle \Sigma_{\text{crit}, ij}^{-1} \rangle$

Methodology

Galaxy lensing

de la Torre et al. 2017

Estimator unbiased if redshifts are perfectly known
→ photometric redshifts

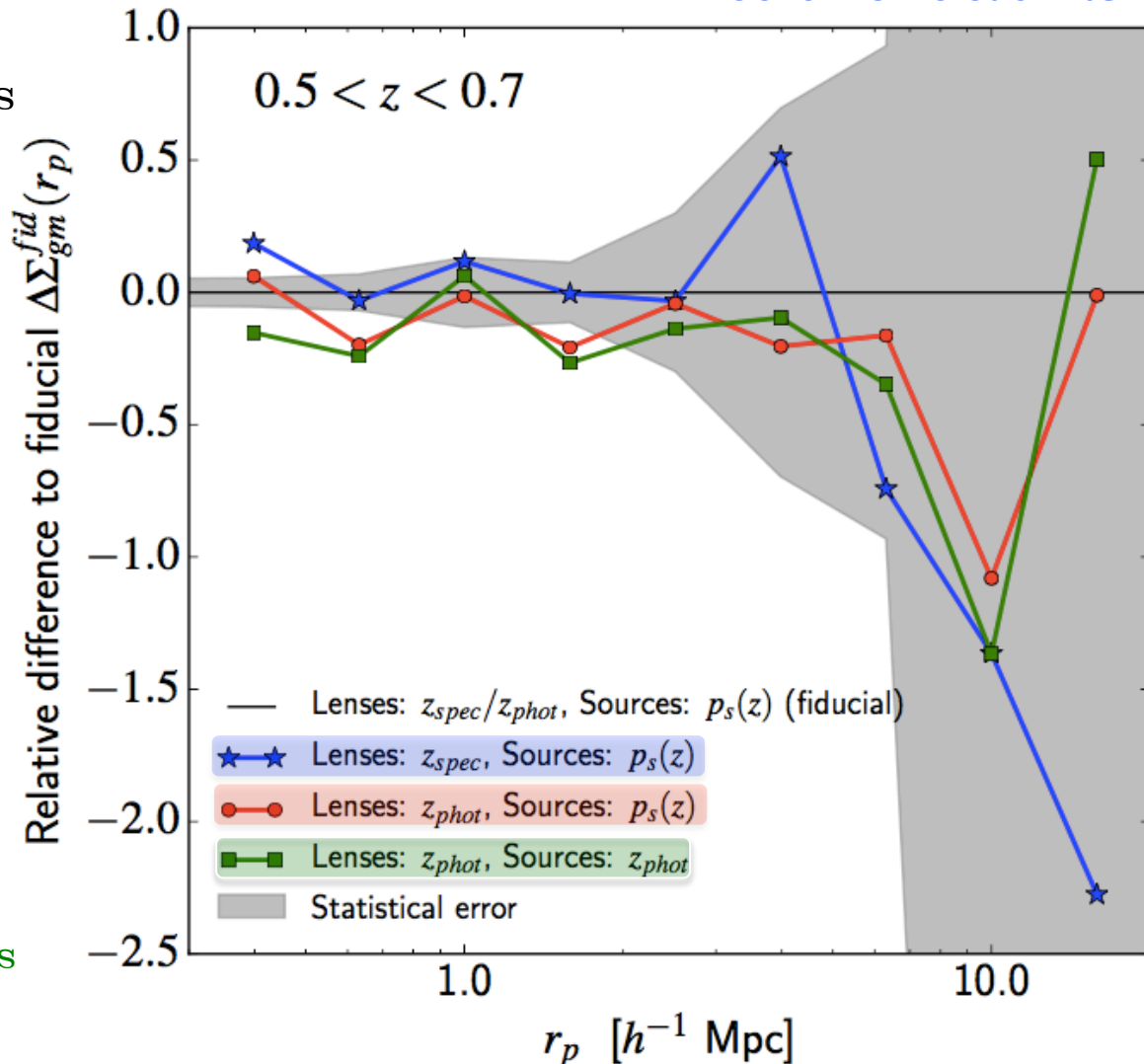
Impact of photometric redshift distribution

➤ Fiducial: Estimator 2 with individual $p_s(z)$ for sources and $z_{\text{spectro/photo}}$ for lenses

Estimator 2 using $p_s(z)$ for lenses and z_{spec} for sources (30%)

Estimator 2 using $p_s(z)$ for lenses and z_{photo} for sources

Estimator 1 using maximum likelihood z for lenses and sources



Methodology

Galaxy lensing

Ellipticity

$$\varepsilon^{\text{obs}} \approx \varepsilon^{\text{s}} + \gamma$$

stack $\rightarrow \langle \varepsilon^{\text{s}} \rangle = 0$

Observable: differential excess surface density

$$\Delta\Sigma_{gm}(r_p) = \frac{\sum_{i=1}^{N_S} \sum_{j=1}^{N_L} w_i^S e_{t,i} \langle \Sigma_{\text{crit}, ij}^{-1} \rangle \Theta_{ij}(r_p)}{\sum_{i=1}^{N_S} \sum_{j=1}^{N_L} w_i^S \langle \Sigma_{\text{crit}, ij}^{-1} \rangle^2 \Theta_{ij}(r_p)}$$

Inverse-variance weight to downweight pairs at close z (average over the source redshift PDF)

related to Ω_m and ξ_{gm}

Weight to account for biases in the determination of ellipticities (using simulations)

Optimal observable for cosmology at ‘large’ scales: annular differential surface density

\rightarrow remove small-scale non-linear contribution below a cut-off radius r_0 ($> 2r_{\text{vir}}$, Baldauf et al. 2010)

$$\Upsilon_{gm}(r_p, r_0) = \Delta\Sigma_{gm}(r_p) - \frac{r_0^2}{r_p^2} \Delta\Sigma_{gm}(r_0).$$

Methodology

Galaxy lensing

de la Torre et al. 2017

Modeling

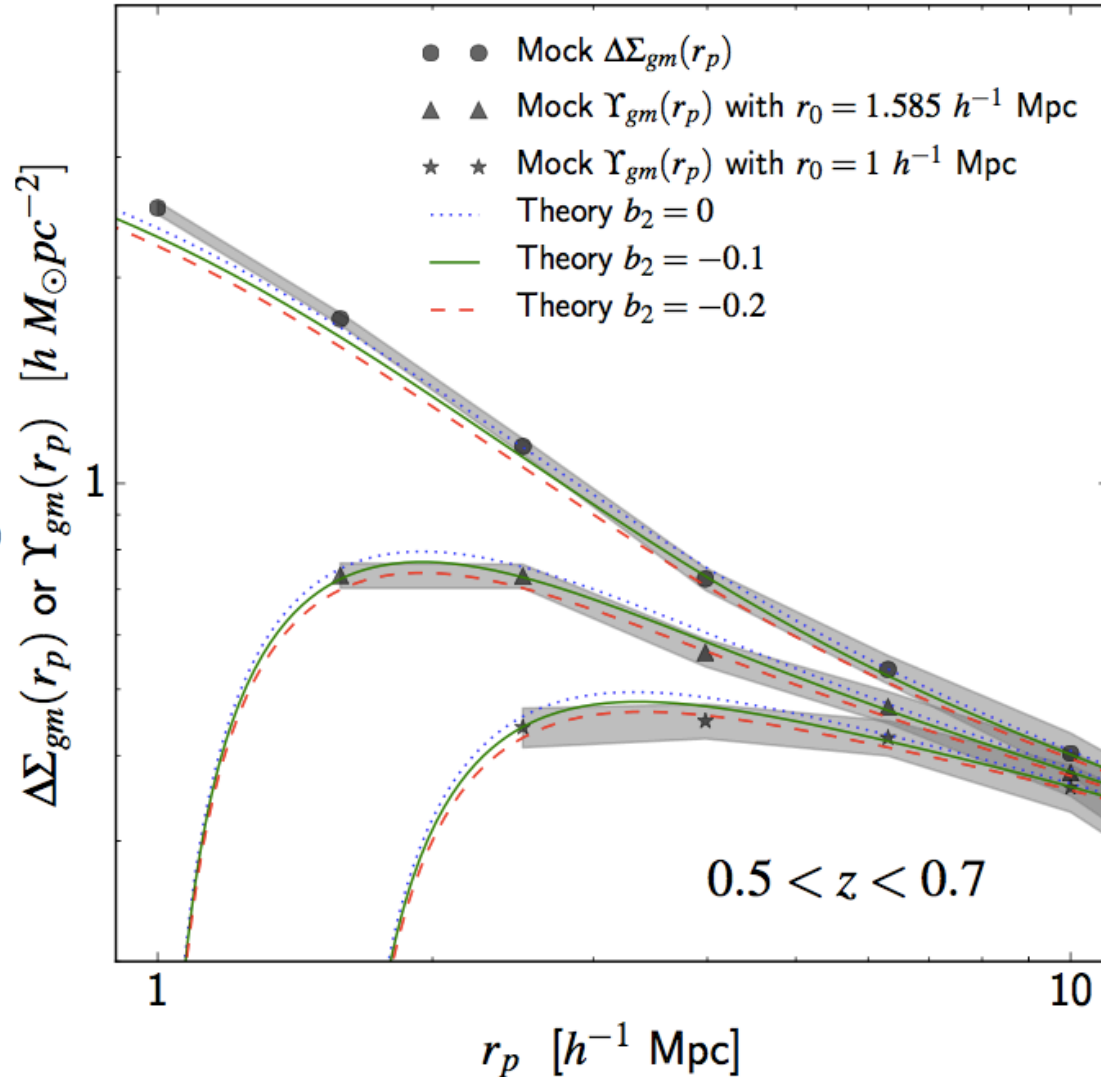
$$\Upsilon_{gm}(r_p) = \int_0^\infty \xi_{gm}(x) W_\Upsilon(x, r_p, r_0) dx$$

window function
Baldauf et al. 2010

→ related to galaxy-matter cross-correlation ξ_{gm}

$$P_{gm}(k) = b_1 P_{\delta\delta}(k) + b_2 P_{b_2, \delta}(k) + b_{s^2} P_{bs^2, \delta}(k) + b_{3nl} \sigma_3^2(k) P_{lin}(k),$$

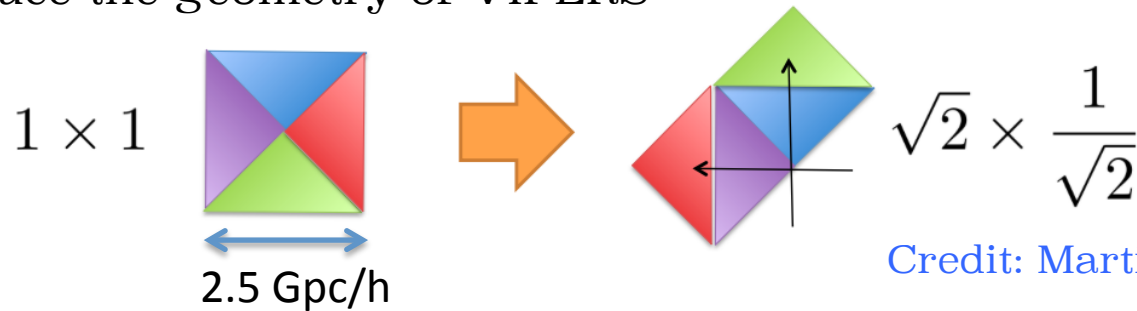
- Bias model from McDonald & Roy 2009
- $P_{\delta\delta}$ from HALOFIT using the latest calibration of Takahashi et al. 2012



Specific tools

Lightcone mocks, Giocoli et al. 2016

- BigMultiDark simulation (BigMDPL, Prada et al. 2014) : 3840^3 particles in 2.5 Gpc/h box size with $m_p = 2.36 \times 10^{10} M_{\text{sun}}/h$
- **Light-cone** construction
 - Step1: Simulate background galaxies with 24 lens planes separated by 161 Mpc/h out to 3.9 Gpc/h comoving + using **remapping** technique to reproduce the geometry of VIPERS



Credit: Martin White

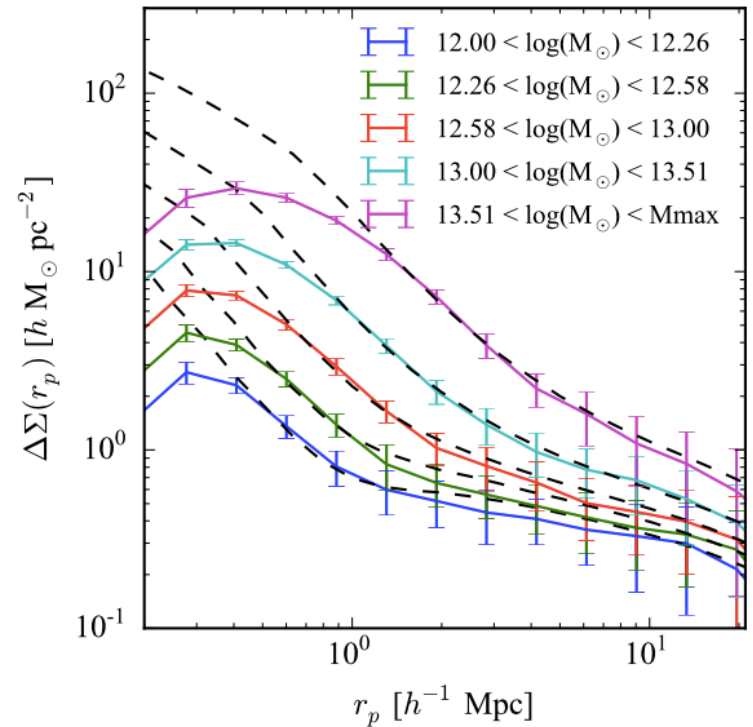
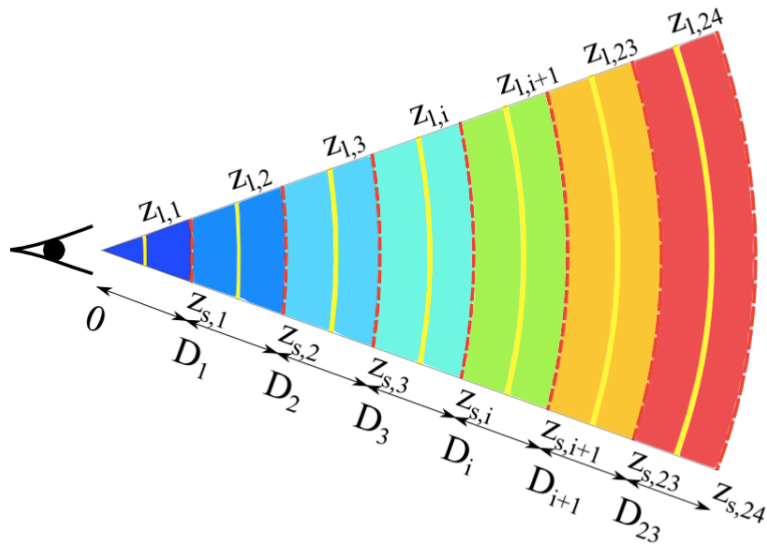
Field name	Size [deg ²]	# Realisations
W1	8.7×1.8	54
W4	5.5×1.6	99

Specific tools

Lightcone mocks, Giocoli et al. 2016

- BigMultiDark simulation (BigMDPL, Prada et al. 2014) : 3840^3 particles in 2.5 Gpc/h box size with $m_p = 2.36 \times 10^{10} M_{\text{sun}}/h$
- **Light-cone** construction
 - Step2: **Ray-tracing** method using GLAMER code (which calculates light paths, shear and convergence) + Gaussian random errors on ellipticities to mimic those in the CFHTLenS data

For each lens plane, compute the Jacobi matrix



Specific tools

Lightcone mocks, [Giacoli et al. 2016](#)

- BigMultiDark simulation (BigMDPL, [Prada et al. 2014](#)) : 3840^3 particles in 2.5 Gpc/h box size with $m_p = 2.36 \times 10^{10} M_{\text{sun}}/h$
- **Light-cone** construction
 - Step3: Populate halos with foreground galaxies using **HOD** + method of de la [Torre & Peacock \(2013\)](#) to **reconstruct halos below the resolution limit** $\rightarrow M_{\text{min}} = 10^{10} h^{-1} M_{\text{sun}}$

5-parameter **Halo Occupancy Distribution** (HOD) model ([Tinker et al. 2012](#))

$$\langle N_{\text{cen}} \rangle_M = \frac{1}{2} \left[1 + \text{erf} \left(\frac{\log M - \log M_{\text{cen}}}{\log \sigma_M} \right) \right]$$
$$\langle N_{\text{sat}} \rangle_M = \left(\frac{M}{M_{\text{sat}}} \right)^{\alpha_{\text{sat}}} \cdot \exp \left(-\frac{M_{\text{cut}}}{M} \right)$$



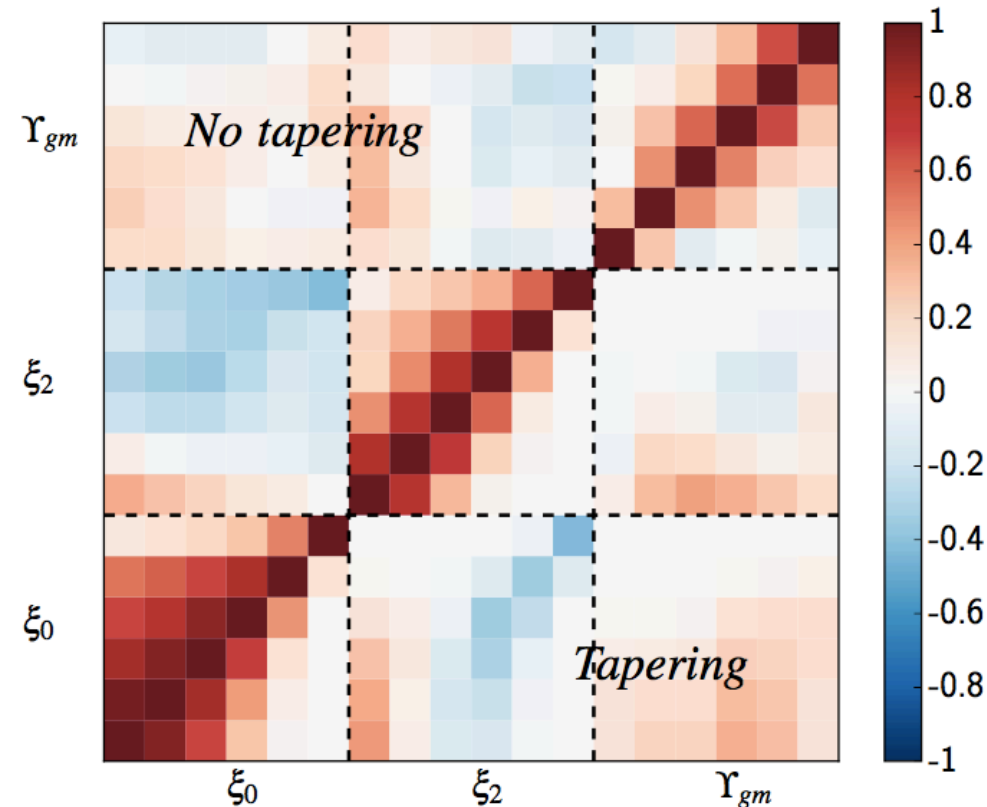
Low-mass halos reconstruction ([de la Torre & Peacock 2013](#))

1. Reconstruct the halo density field from the simulation catalog
2. Use the conditional mass function to populate the simulation with halos below the resolution limit
 - \rightarrow Shape of halo mass function $n(m)$
 - \rightarrow Bias factor $b(m)$For both, use analytic formulae from [Tinker et al. 2008](#)

- Step4: Apply VIPERS selection function

Specific tools

Covariance matrix



- Covariance matrix estimated from 54 mocks
- **Tapering** technique to reduce noise (Paz & Sanchez 2015)
 - narrow the covariance matrix around the diagonal using a positive and compact taper function
 - Depends on a tapering scale: scale above which covariances are nullified. Here, $T_p = 15 \text{ h}^{-1}\text{Mpc}$

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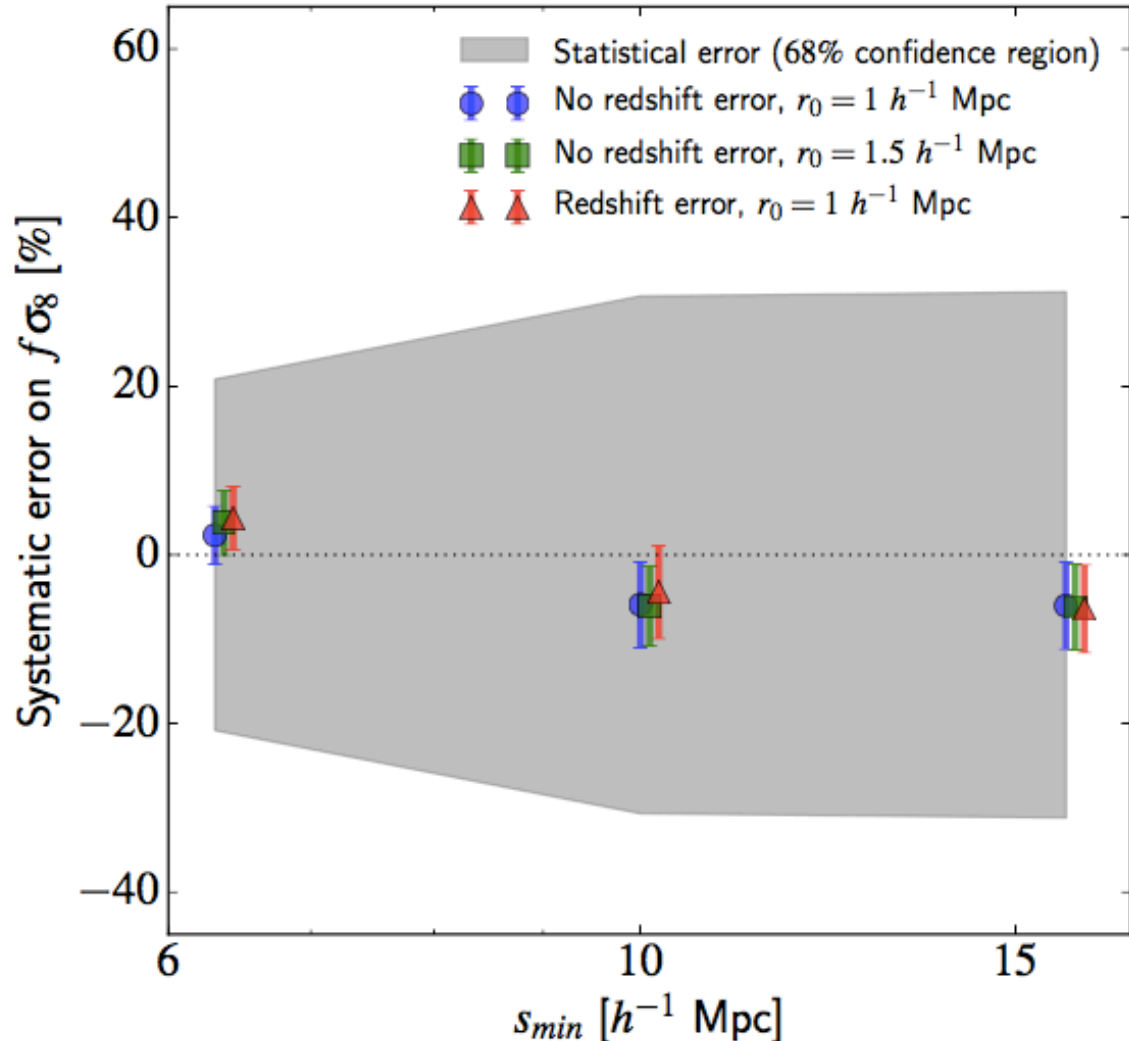
4a Tests

4b Measurements

IV) Cosmological results

Tests

Fitting range and redshift uncertainties



FS analysis in BOSS/eBOSS

- BOSS galaxies @ $z \sim 0.5$:
 $s_{\min} = 20 h^{-1} \text{ Mpc}$, $k_{\max} = 0.15 h \cdot \text{Mpc}^{-1}$
- eBOSS quasars @ $z = 1.5$:
 $s_{\min} = 20 h^{-1} \text{ Mpc}$, $k_{\max} = 0.3 h \cdot \text{Mpc}^{-1}$

BOSS $\mathbf{P}(\mathbf{k}) + \mathbf{B}(\mathbf{k})$ @ $z \sim 0.5$, [Gil-Marín et al. 2017](#): $k_{\max} = 0.2 h \cdot \text{Mpc}^{-1}$

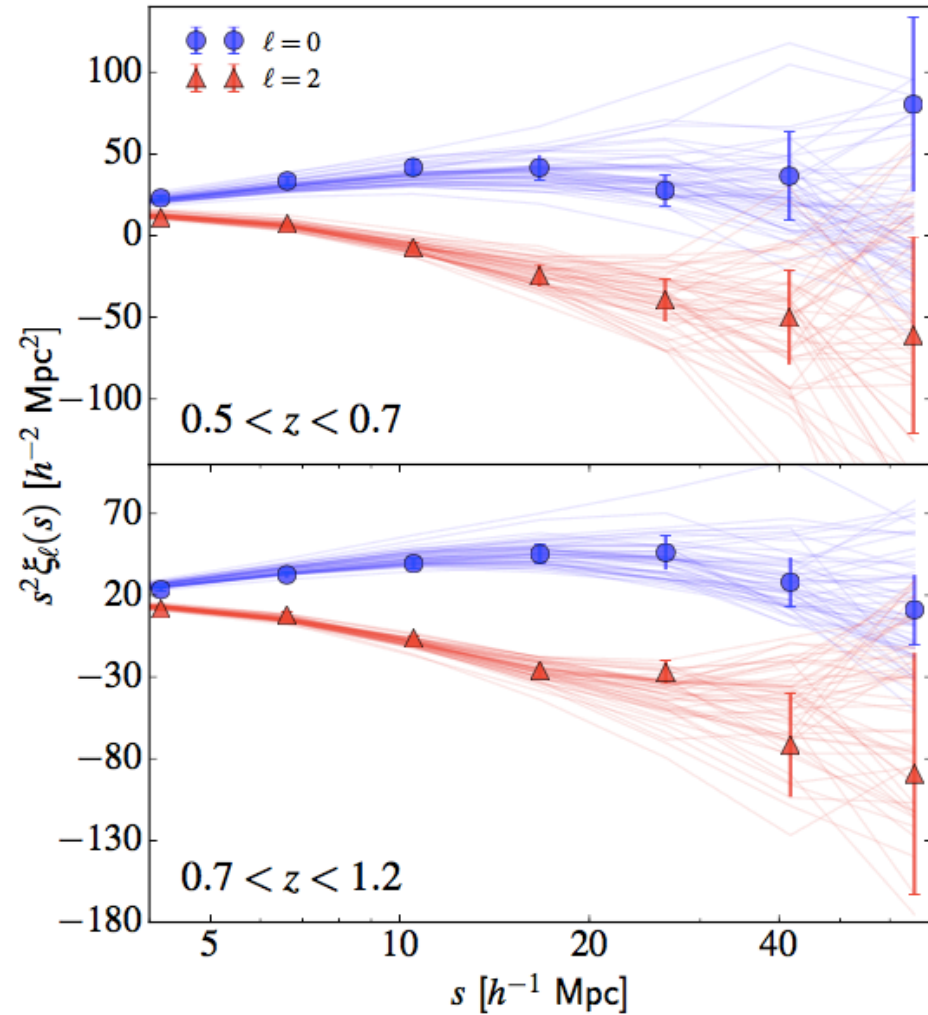
FS analysis in VIPERS

[Pezzotta et al. 2017](#), [Mohammad et al. 2017](#) $s_{\min} = 5 h^{-1} \text{ Mpc}$

→ **For GC + GL joint analysis, ability to reach small scales is key. Here $s_{\min} =$**

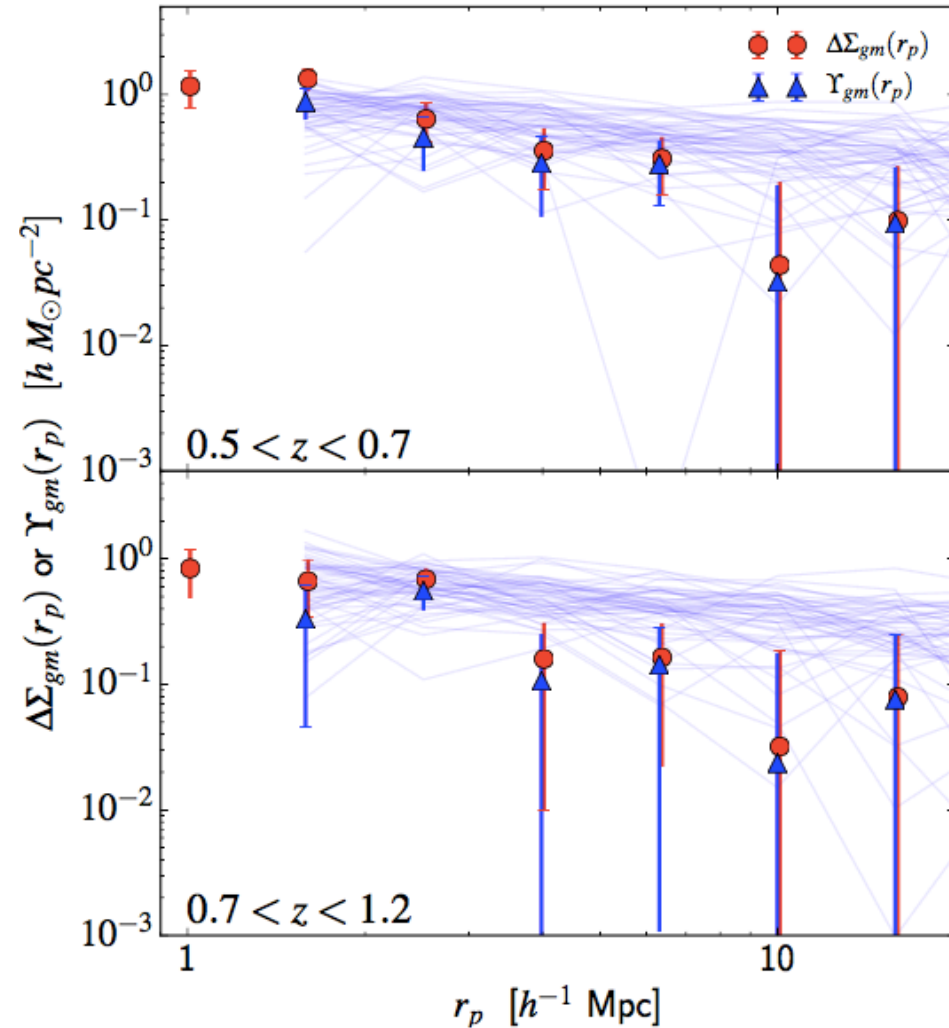
Measurements

Legendre multipoles: $\xi_0 \xi_2$
 \rightarrow relative error on ξ_0 of 5%



Lensing: $\Delta\Sigma_{\text{gm}}$ or Y_{gm}

\rightarrow relative error on $\Delta\Sigma_{\text{gm}}$ of 25%
 \rightarrow Dominated by unknown ε^{S}



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4a Joint likelihood

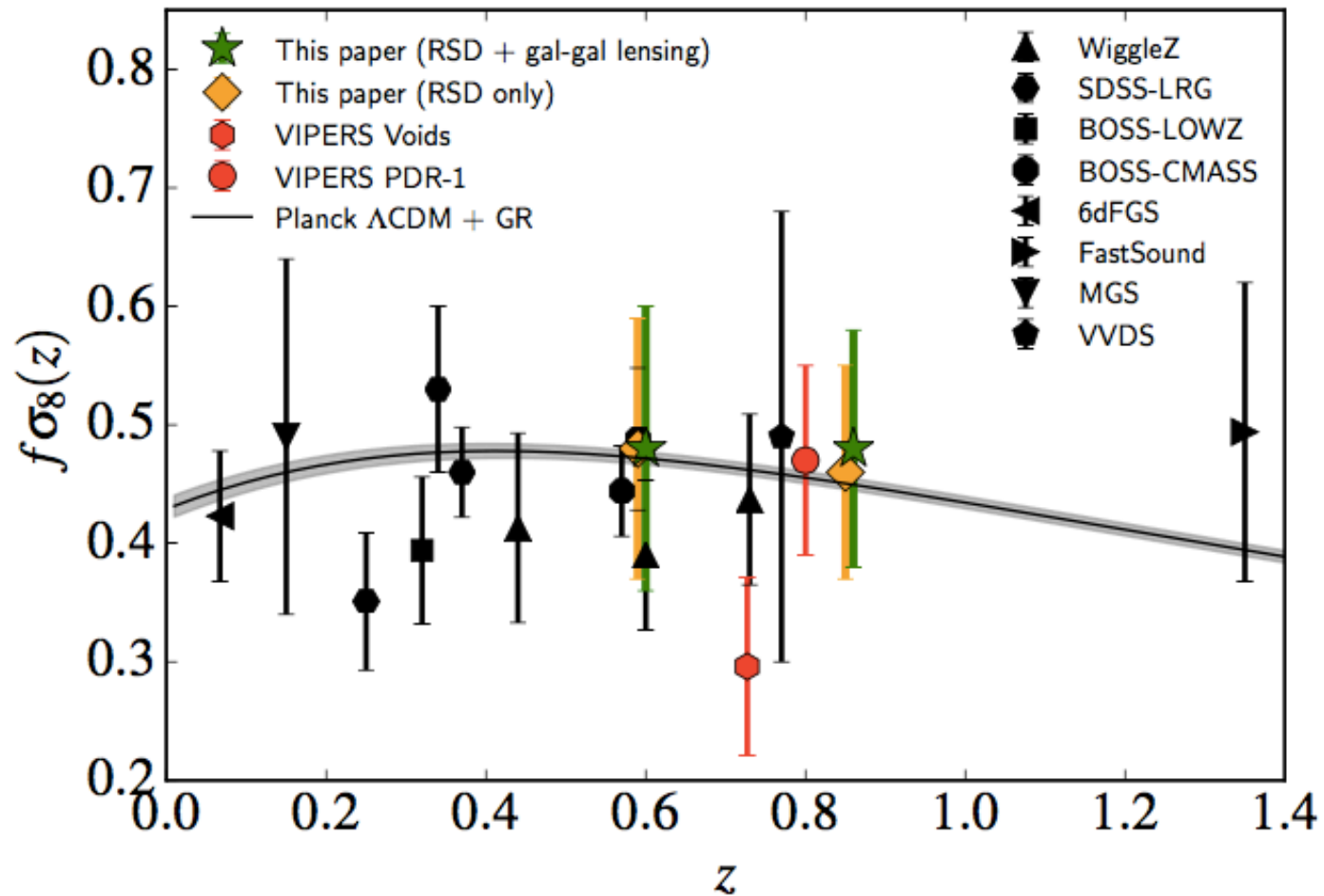
4b Tests

IV) Cosmological results

Cosmological results

Growth rate

- No significant gain on $f\sigma_8$ when adding lensing



With galaxy lensing

$$f\sigma_8(z = 0.6) = 0.48 \pm 0.12$$

$$f\sigma_8(z = 0.86) = 0.48 \pm 0.10,$$

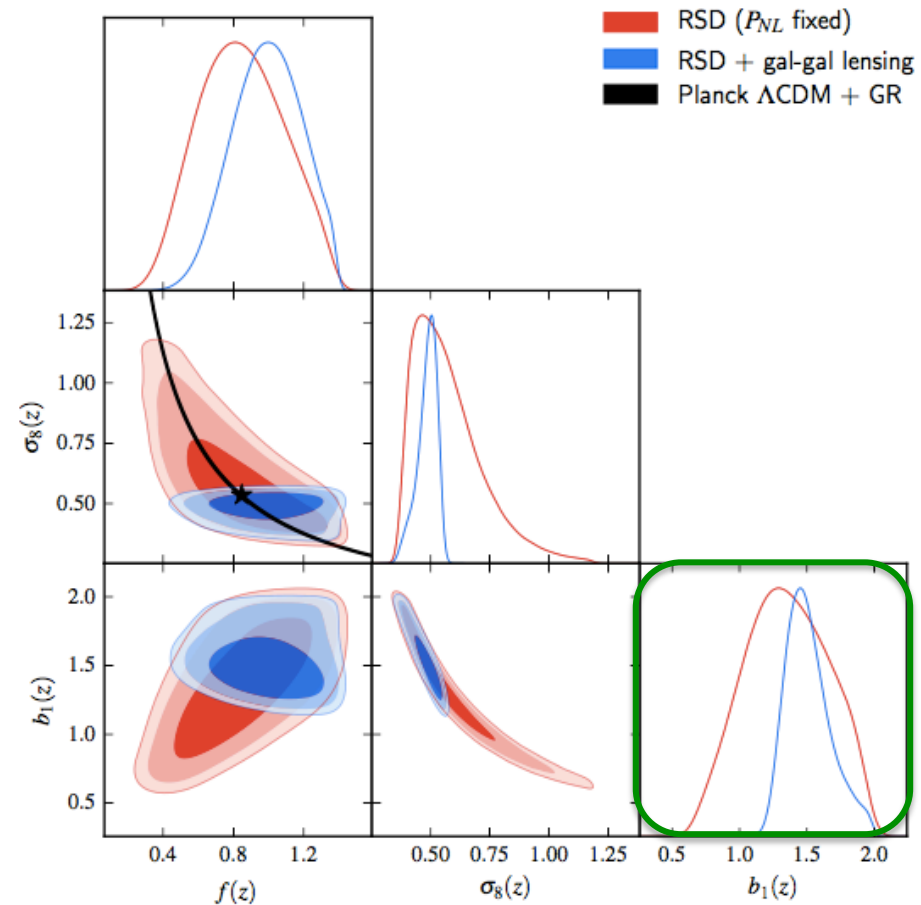
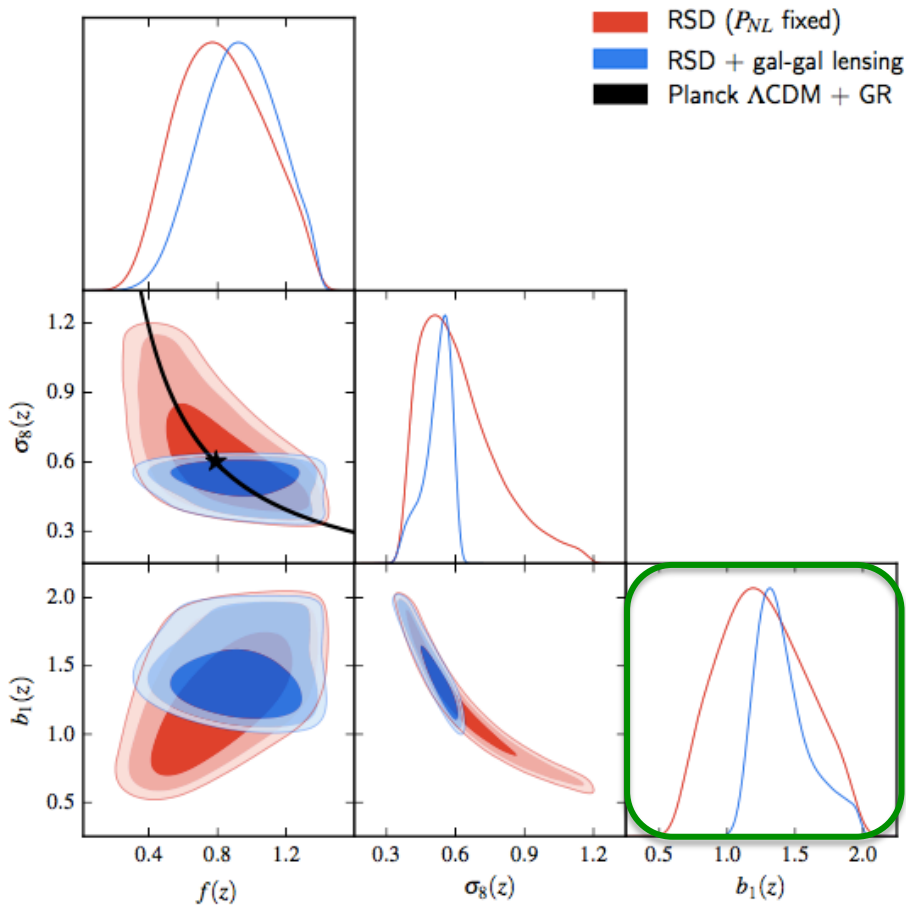
Without galaxy lensing

$$f\sigma_8(z = 0.6) = 0.48 \pm 0.11$$

$$f\sigma_8(z = 0.86) = 0.46 \pm 0.09,$$

Cosmological results

Breaking degeneracies



- But degeneracies between b_1 , f and σ_8 can be broken!
- Particularly powerful for constraints on **1st-order bias**

Cosmological results

Breaking degeneracies

➤ At $z=0.6$

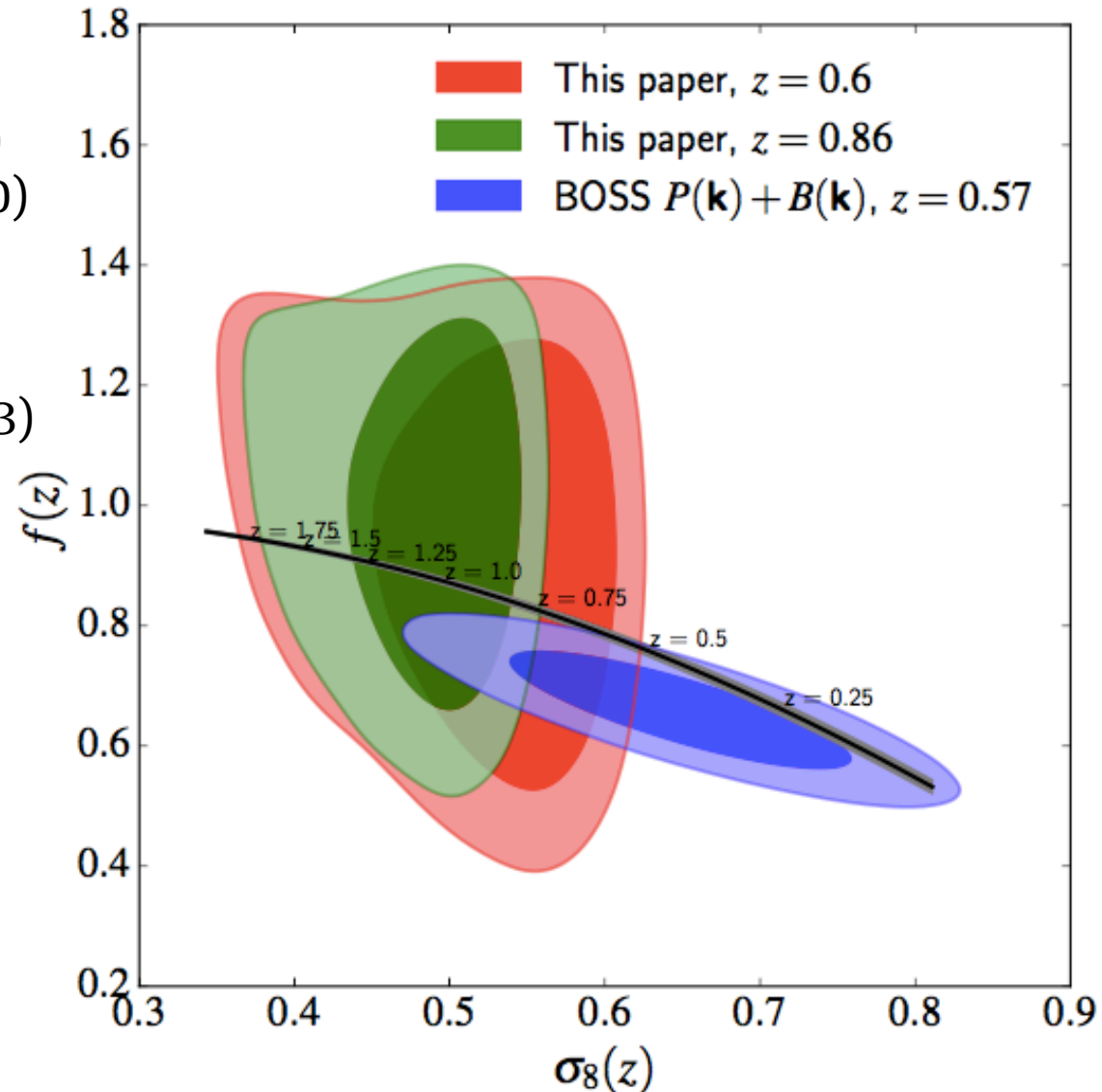
$$(f, \sigma_8) = (0.93 \pm 0.22, 0.52 \pm 0.06)$$

$$\Lambda\text{CDM+GR: } (f, \sigma_8) = (0.79, 0.60)$$

➤ At $z=0.86$

$$(f, \sigma_8) = (0.99 \pm 0.19, 0.48 \pm 0.04)$$

$$\Lambda\text{CDM+GR: } (f, \sigma_8) = (0.85, 0.53)$$



Cosmological results

E_G parameter

- Gravitational split

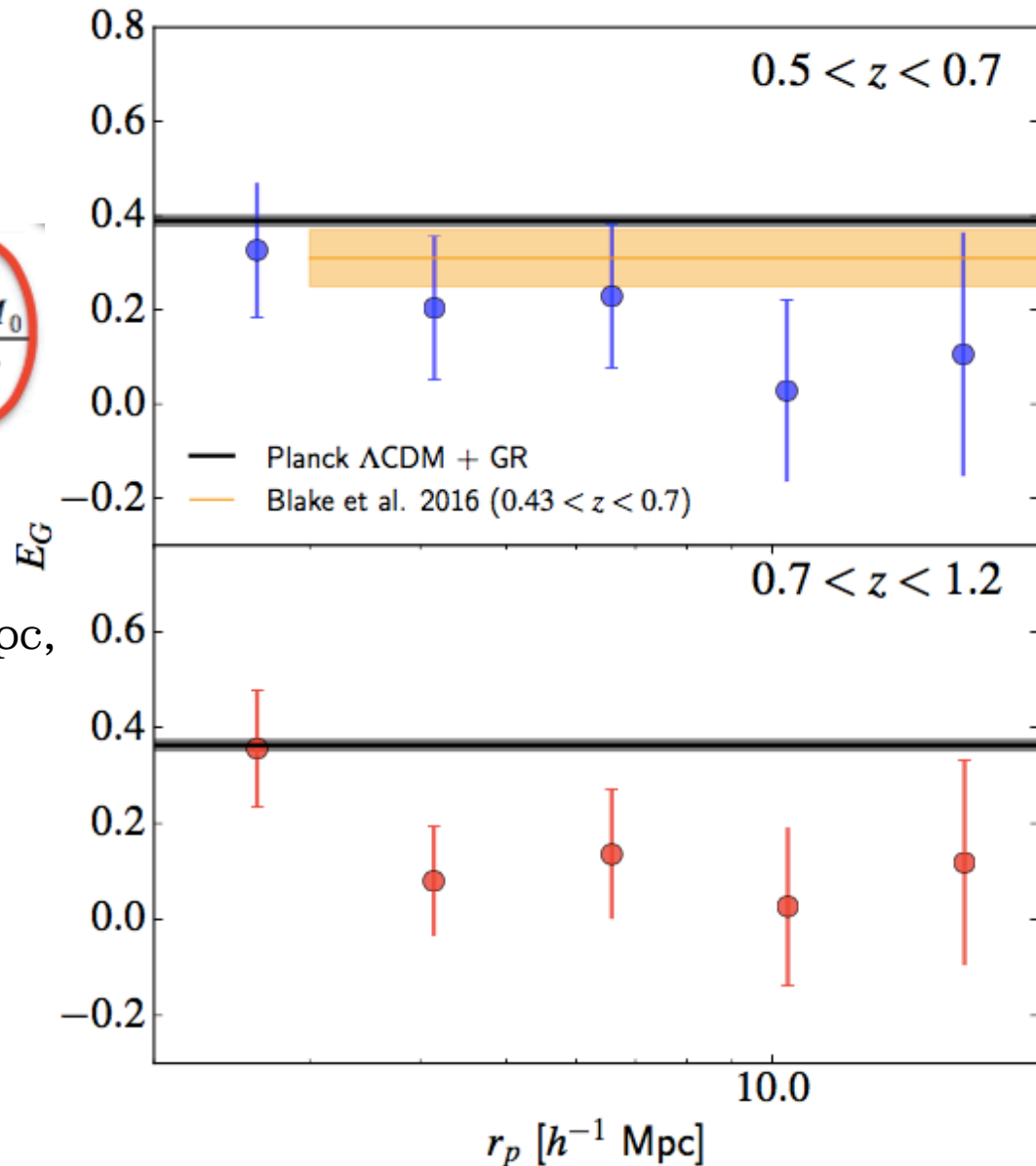
$$E_G \equiv \frac{\nabla^2(\psi - \phi)}{3H_0^2 a^{-1} \beta \delta} = \frac{1 \boxed{Y_{gm}}}{\beta \boxed{Y_{gg}}} \propto \frac{b}{f} \frac{\Omega_{M_0}}{b} \approx \boxed{\frac{\Omega_{M_0}}{f}}$$

Zhang et al. 2007

- By averaging over $3 < r_p < 20 \text{ h}^{-1} \text{Mpc}$,
 $E_G(z=0.6) = 0.16 \pm 0.09$
 $E_G(z=0.86) = 0.09 \pm 0.07$

→ **In good agreement with previous measurements**

→ **Slightly lower than the predictions from $\Lambda\text{CDM}+\text{GR}$**



Takeaway

- GC sensitive to φ → measures $b_1\sigma_8$ and $f\sigma_8$
- GL sensitive to $\varphi + \phi$ → measures b_1 and σ_8
- Joint analysis of GC+GL:
 - can **break degeneracies** between b_1, f and σ_8
 - provide additional **direct tests of GR**: potentials, gravitational split E_G
- In [de la Torre et al. 2017](#):
 - Lensing: background sources from **CFHTLenS**
 - Clustering: foreground galaxies from **VIPERS**
 - **Joint likelihood** to combine $\xi_0, \xi_2, \Delta\Sigma_{\text{gm}}$ or Y_{gm}
 - Modeling from $s_{\text{min}} = 8 \text{ Mpc}/h$
 - Account for systematics related to spectroscopic incompleteness
 - Account for systematics related to redshift uncertainties
 - **Results on $f\text{-}\sigma_8$** : at $z=0.60$ (f, σ_8) = $(0.93 \pm 0.22, 0.52 \pm 0.06)$
at $z=0.86$ (f, σ_8) = $(0.99 \pm 0.19, 0.48 \pm 0.04)$
 - **Results on E_G** in agreement with previous measurements, slightly lower than predictions from $\Lambda\text{CDM}+\text{GR}$

Prospects

Future joint analysis

VIPERS +
dT et al. 2017
BOSS CMASS
Jullo et al. (in prep)

DESI +
eBOSS +
(e)BOSS/DESI+

DESI +

Survey	Date	Area [deg ²]	n_{gal} [arcmin ⁻²]
CFHTLenS	2003-2007	170	14
DLS	2001-2006	25	20
COSMOS	2005	1.6	80
SDSS	2000-2012	11,000	2
KiDS	2011-	1,500	7-8
HSC	2015-	1,500	~20 22
DES	2012-2018	5,000	5-6
CFIS	2017-2020	5,000	6-7
LSST	2021-	15,000	~ 30
Euclid	2021-2026	15,000	~ 30
WFIRST-AFTA	2024-	2,500	?

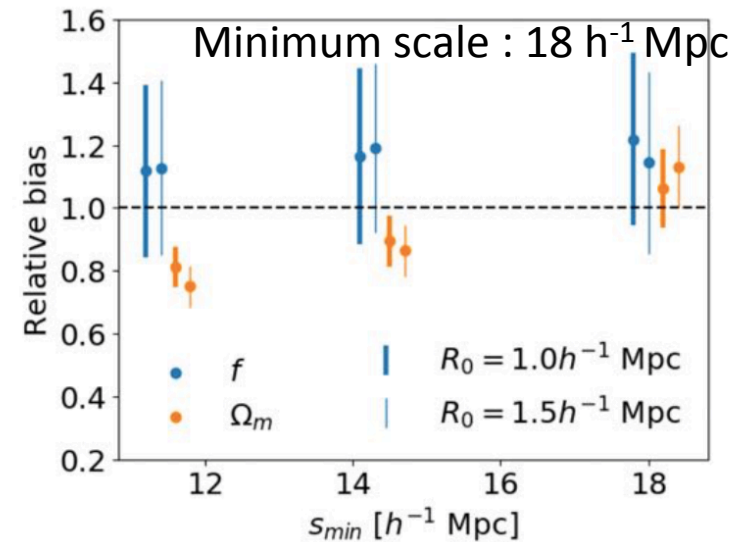
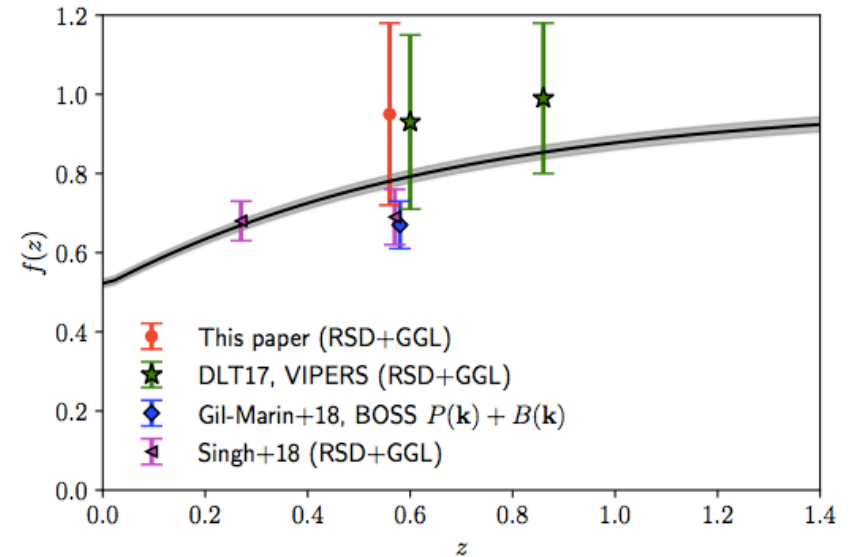
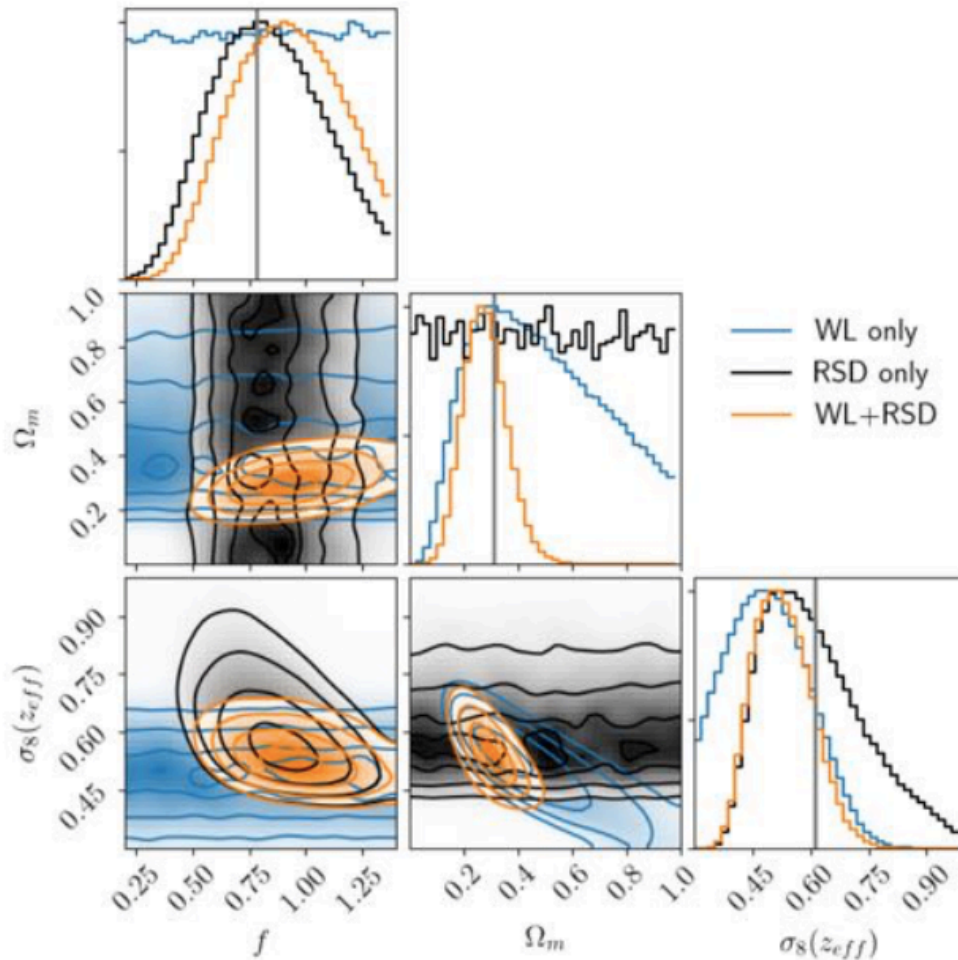
from Martin Kilbinger @Euclid Summer school 2017

Overlapping area

- eBOSS + DES: 600 deg² sur le Fat Stripe 82
- CFIS + BOSS: 2,500 deg² / + eBOSS: 3,000 deg²
- DESI + HSC : 1,000 deg²
- DESI + LSST : current 3,000 deg² / possible 7,000 deg²

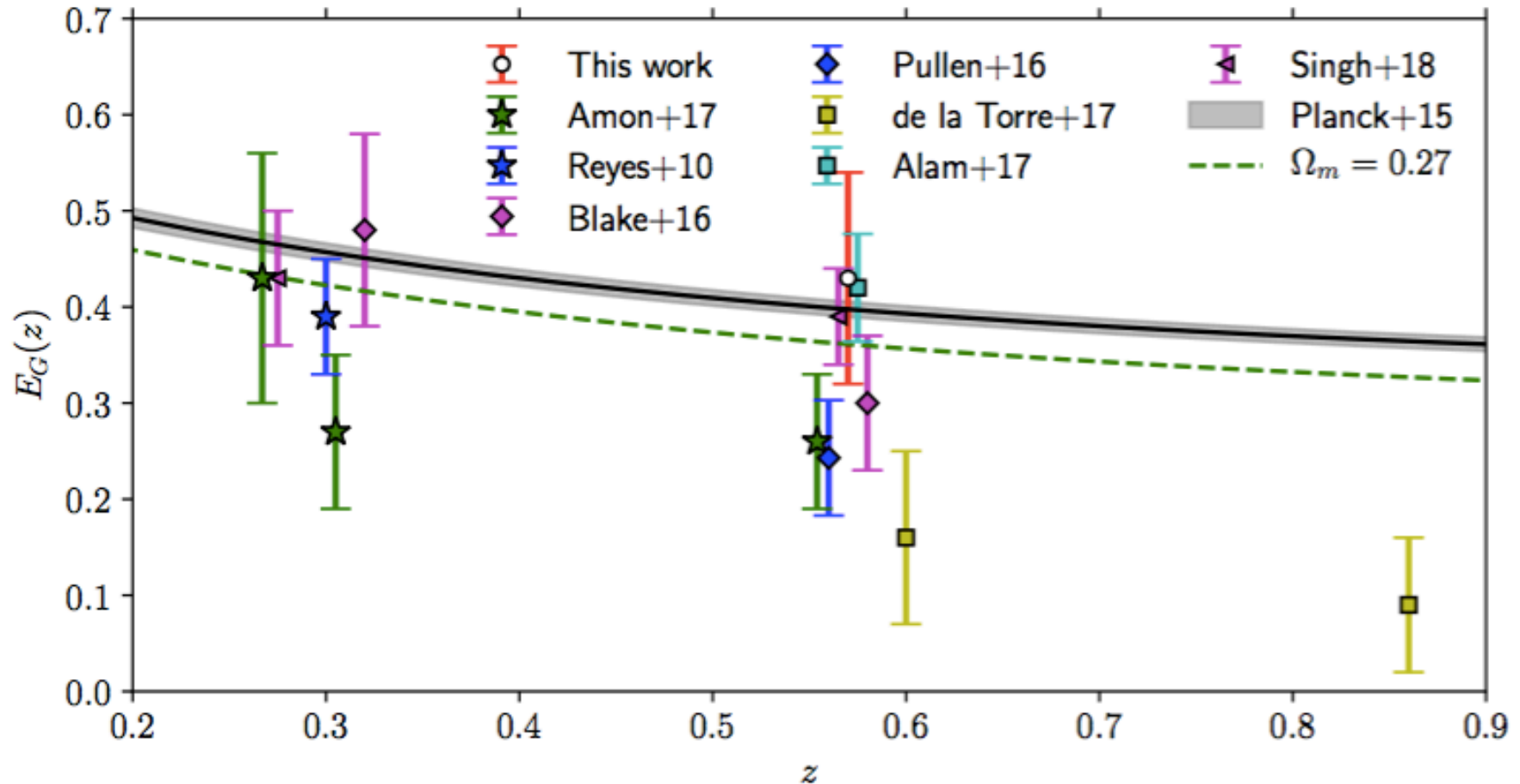
Teaser

Joint BOSS CMASS and CFHTLens, Jullo et al. (in prep)



Teaser

Joint BOSS CMASS and CFHTLenS, Jullo et al. (in prep)



Bibliography

➤ E_G parameter

[Reyes et al. 2010](#)

➤ Joint GC + GL

[Baldauf et al. 2010](#)

[Mandelbaum et al. 2010](#)

[Mandelbaum et al. 2013](#)

[Blake et al. 2016](#)

[de la Torre et al. 2017](#)

[Jullo et al. 2018 \(submitted\)](#)

➤ Mocks with lensing and galaxies

[Giacoli et al. 2016](#) and references therein

➤ CMB lensing + galaxy clustering

[Pullen et al. 2016](#)



Canada-France-Hawaii Telescope Legacy Survey: Canada-France collaboration

- 500 nights between June 2003 and June 2008

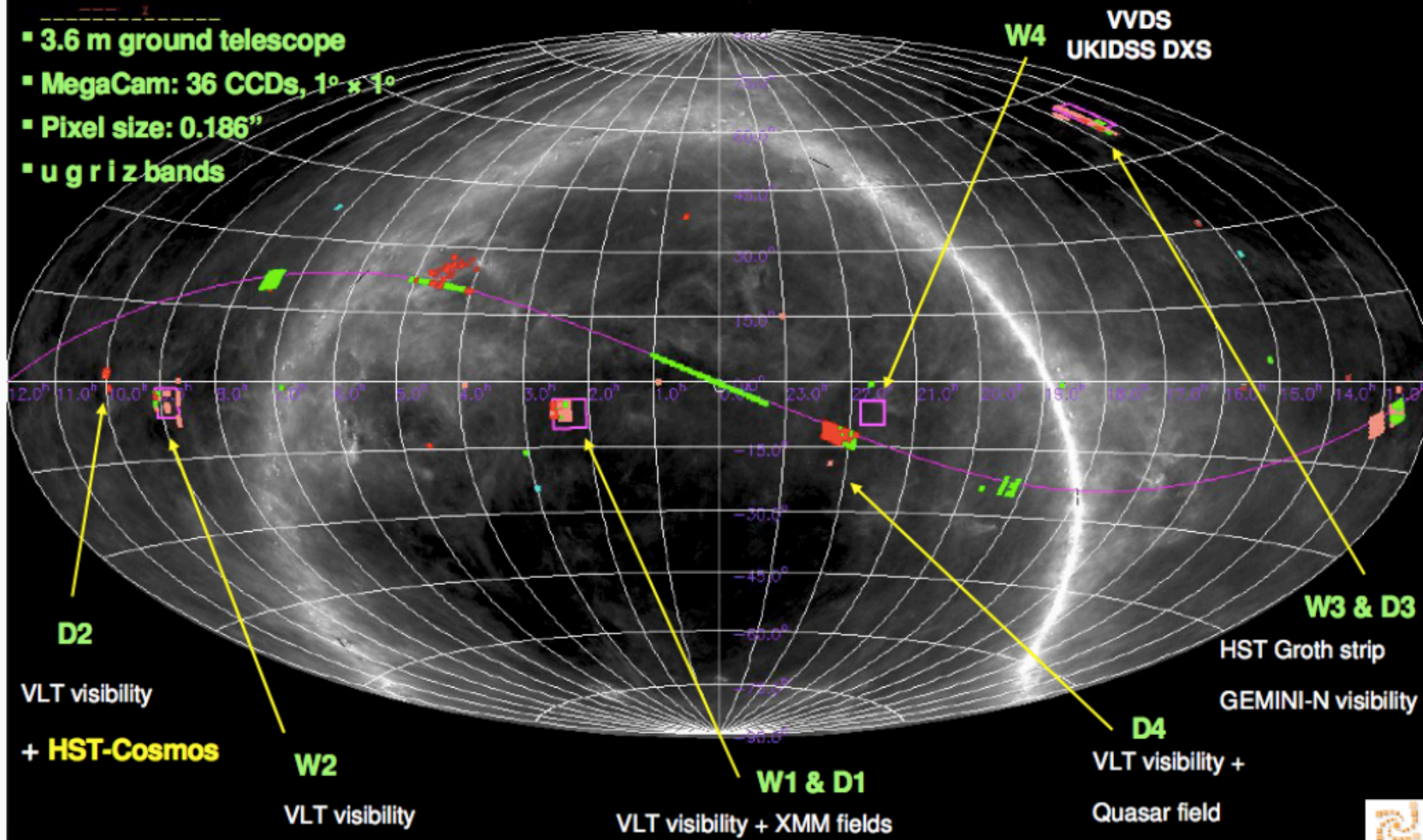
- 4 CFHTLS-Wide (170 deg²), 4 CFHTLS-Deep (1 deg² each)

▪ 3.6 m ground telescope

▪ MegaCam: 36 CCDs, 1° x 1°

▪ Pixel size: 0.186"

▪ u g r i z bands



VVDS spectro. survey

Terapix/Skywatcher : all data 03A-05A : 20000 Megacam images



+command line : skywatcher