

# Measuring cosmological parameters in the large scale structure through redshift space distortions and Alcock- Paczynski effects

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*Laboratório Interinstitucional de e-Astronomia  
13th June 2019*



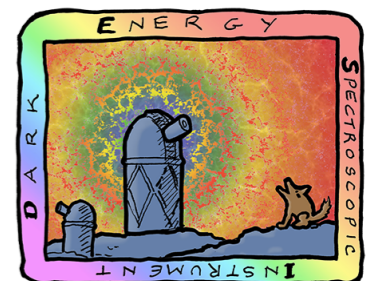
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MARÍA  
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"la Caixa" Foundation

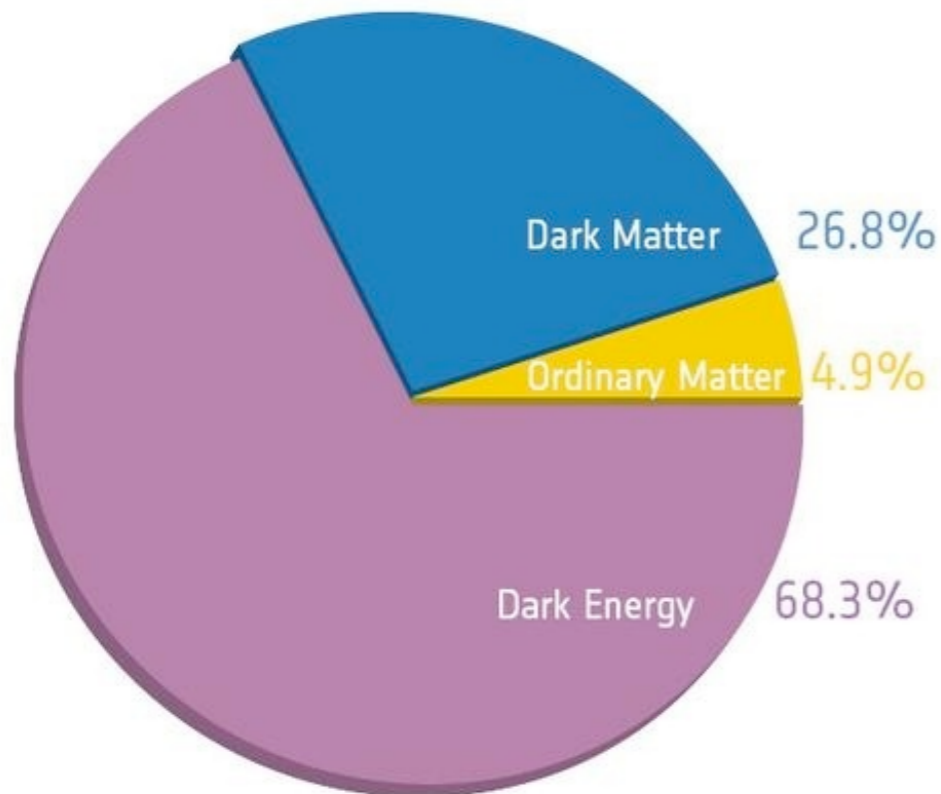


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# Outline

1. Introduction to cosmology with LSS: BAO and RSD
2. Cosmology with galaxy surveys: BOSS & eBOSS
3. Higher-order statistics: the bispectrum
4. Future analyses: DESI

# Cosmological Standard Model



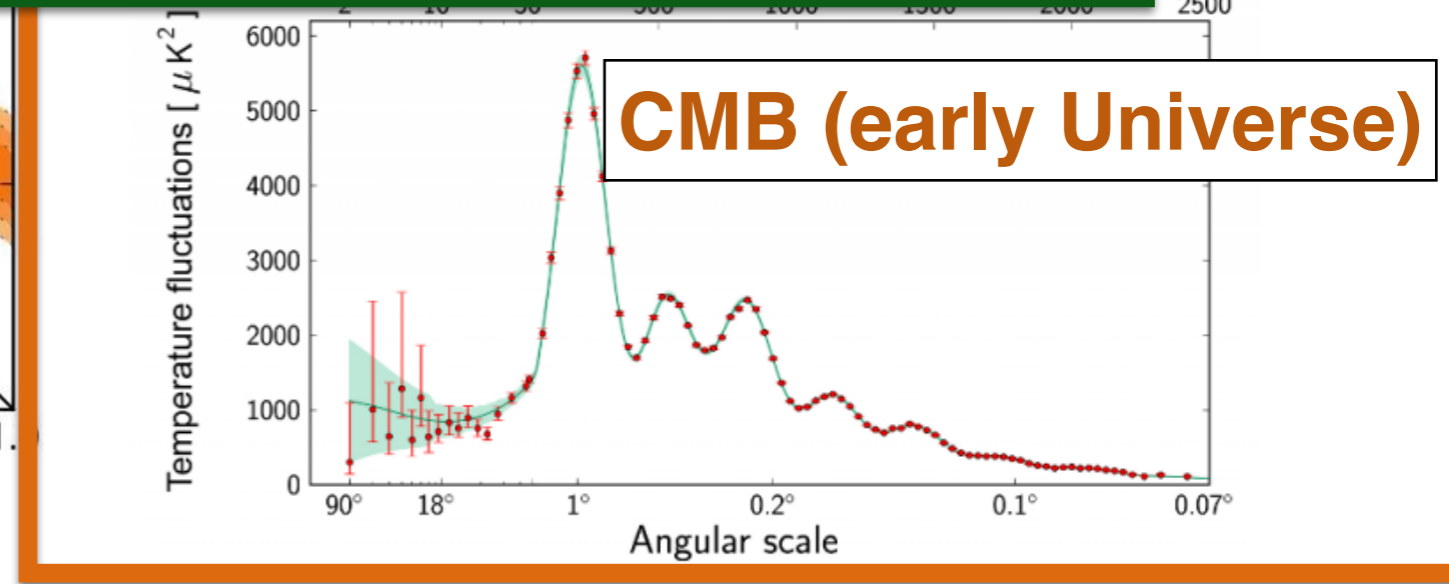
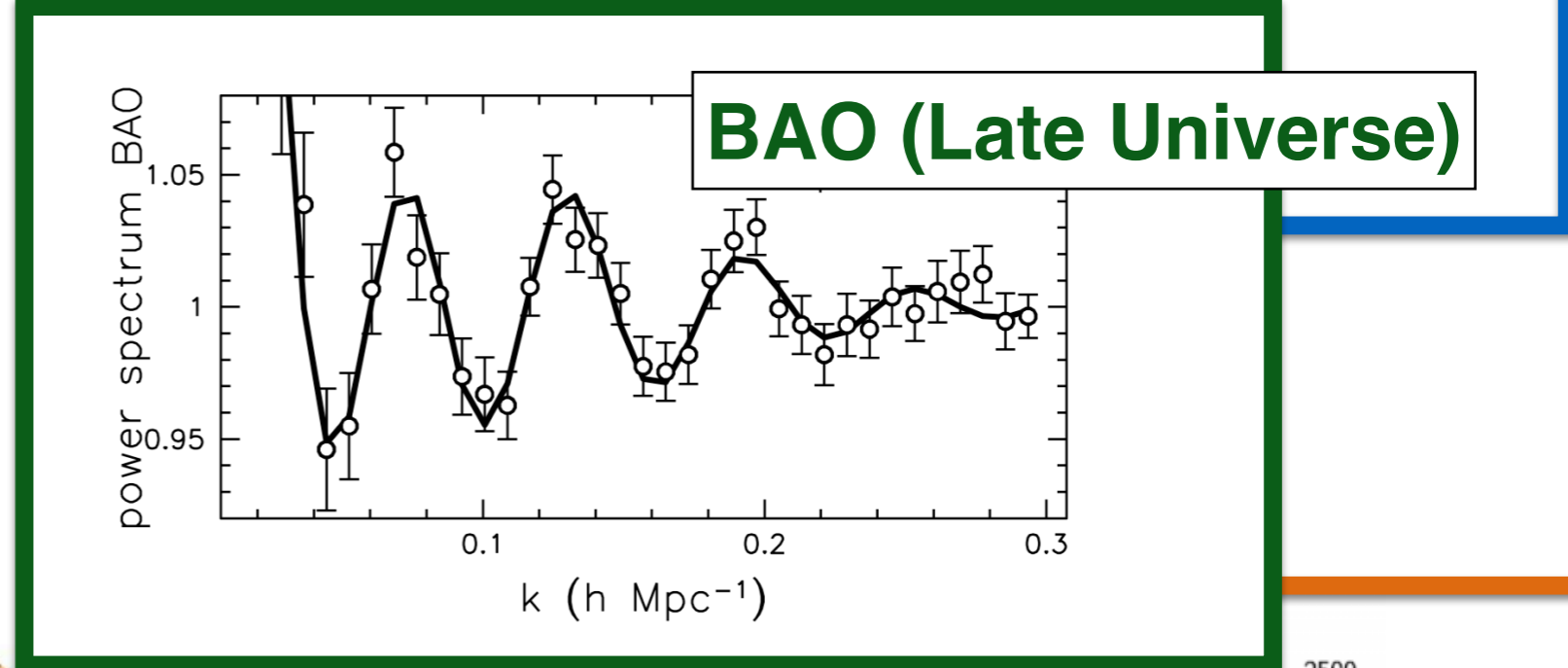
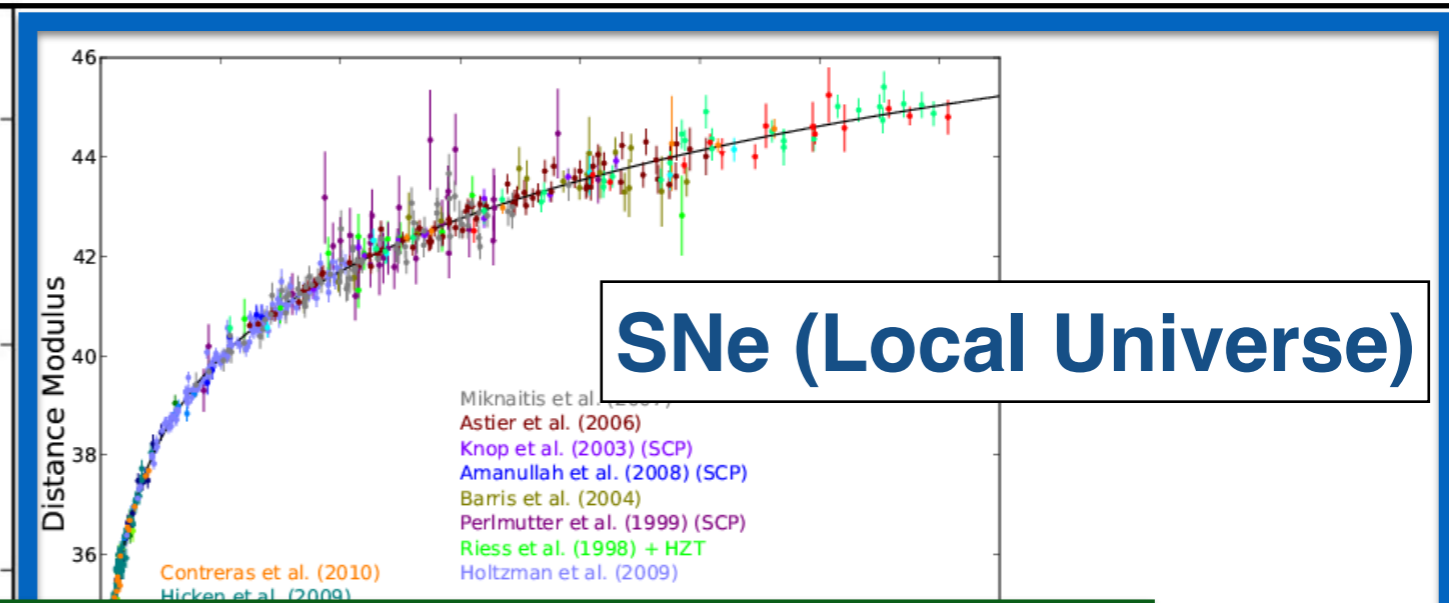
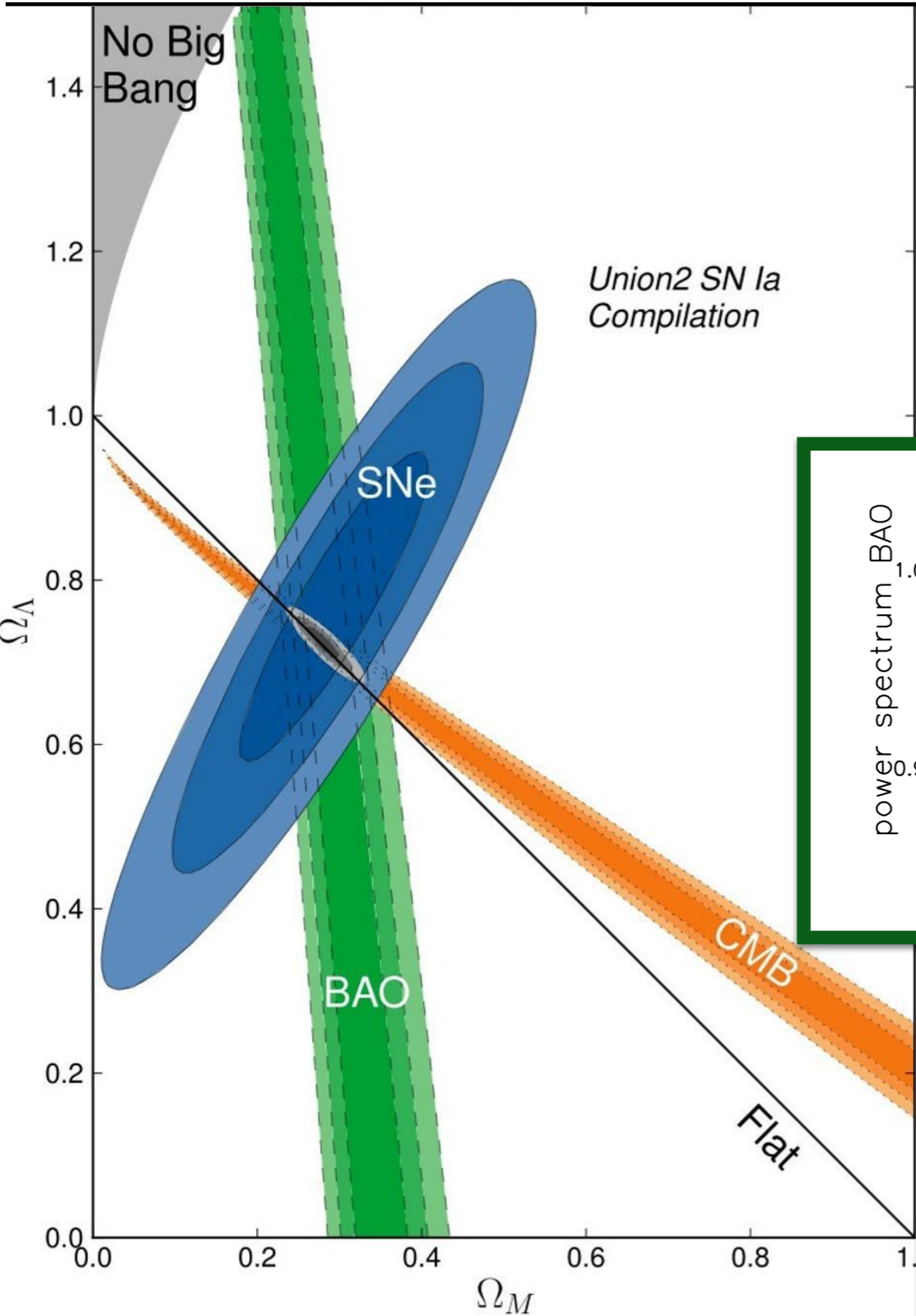
CMB observations (WMAP, Planck)

- Flat Universe
- Universe dominated by **dark** components

Within the context of GR **Dark Energy** is understood as a macroscopic manifestation of the quantum vacuum energy

Other possibilities: modify GR, scalar field, ...

**Different expansion rate through time and different logarithmic growth of structure factor.**

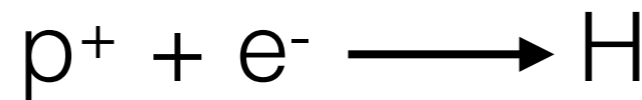


# Baryon Acoustic Oscillations

Before recombination

After recombination

at  $z \sim 1100$



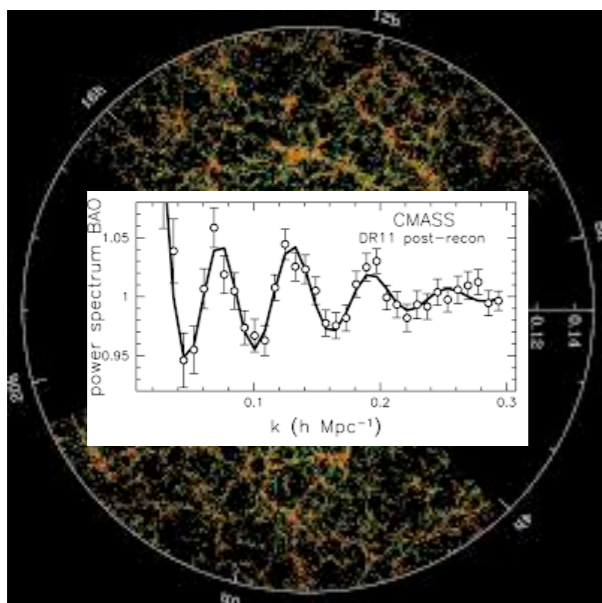
Baryons+DM

Wave propagation frozen

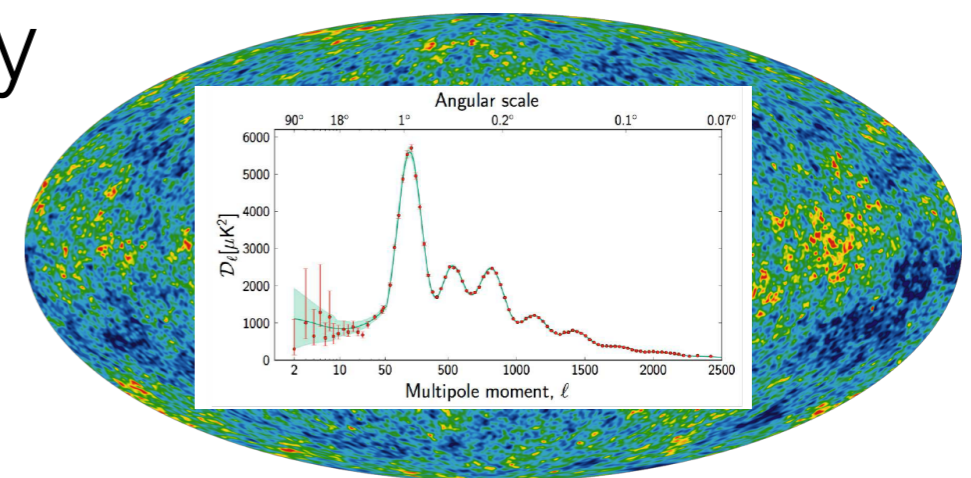
photons

Galaxies

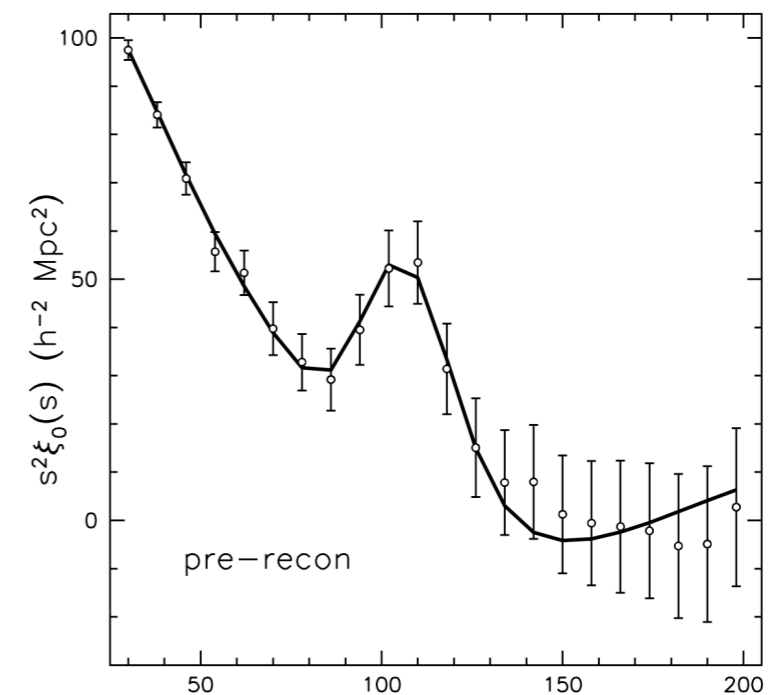
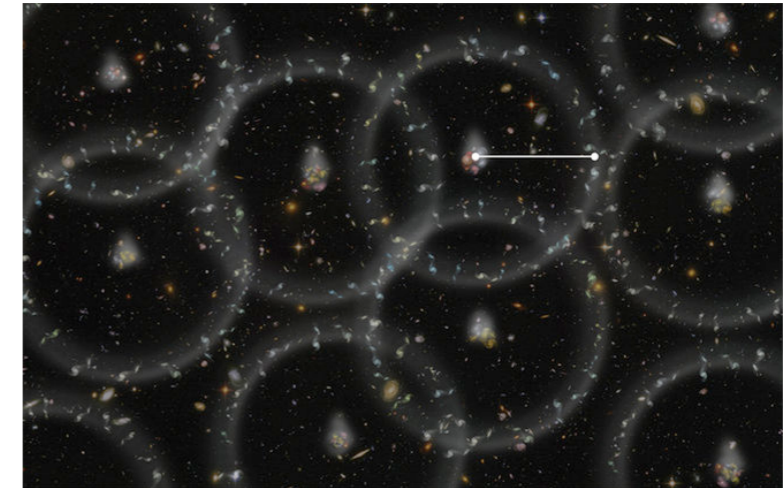
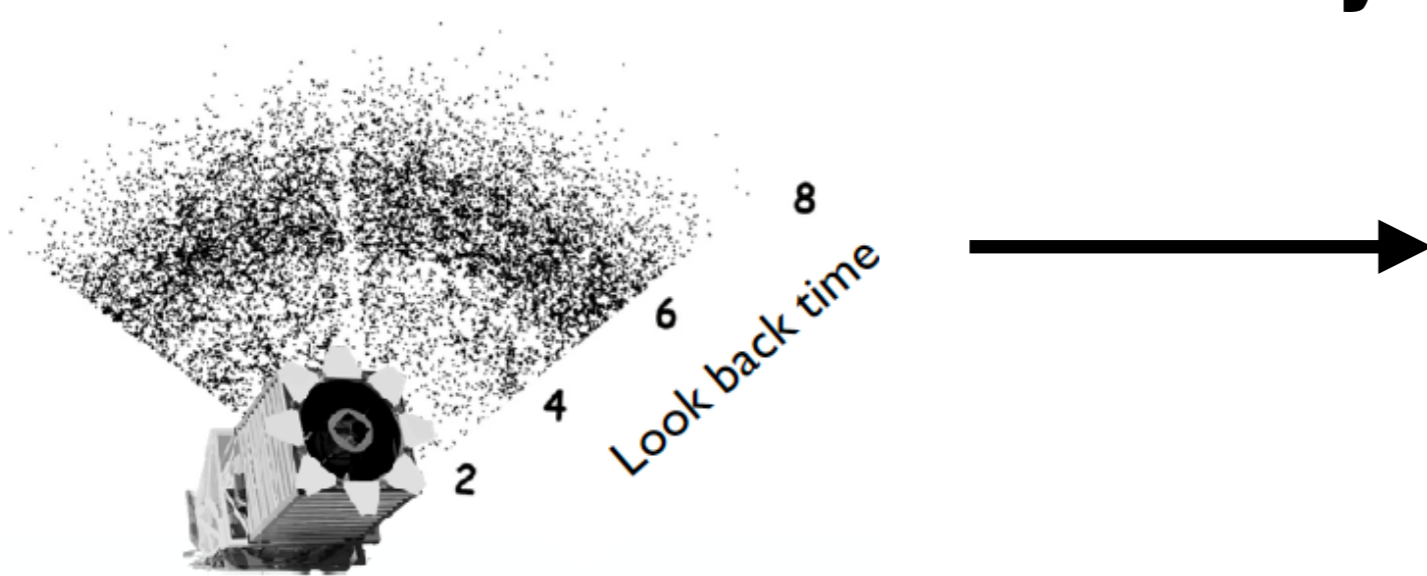
CMB



- Physics in early Universe
- Accelerated expansion at late times



# Main Goal of redshift surveys: BAO & RSD



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**Growth of structure:** Ratio monopole to quadrupole  $\sim f\sigma_8$

**BAO peak position:** Isotropic signal  $\sim (D_A^2/H)^{1/3} / r_s$

**BAO relative peak position:** isotropic vs. anisotropic  $\sim D_A H$



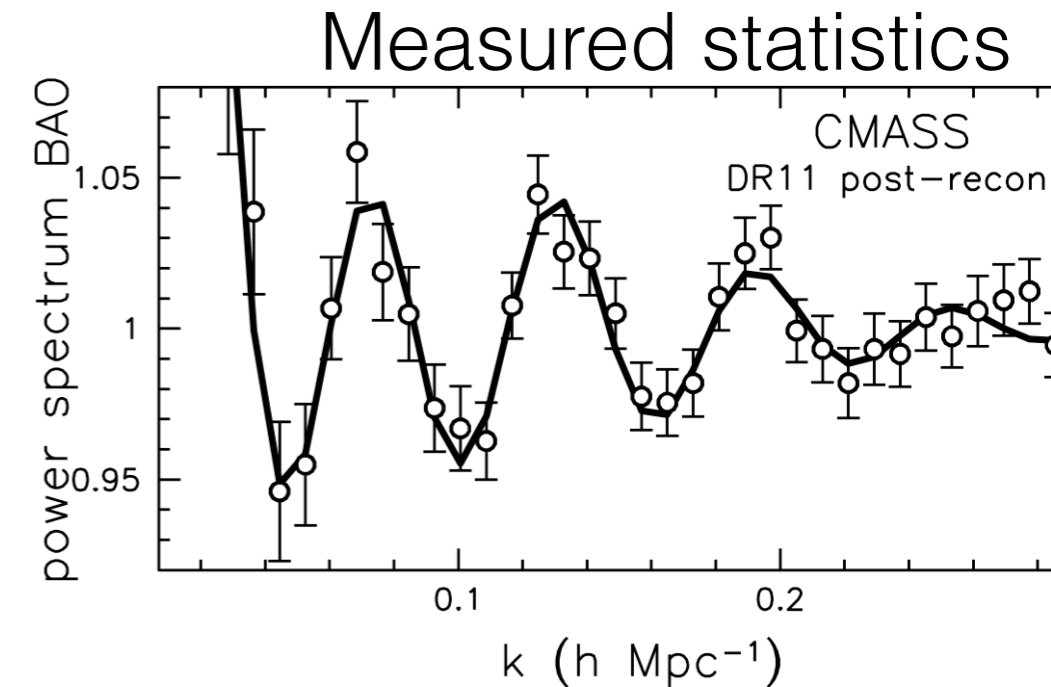
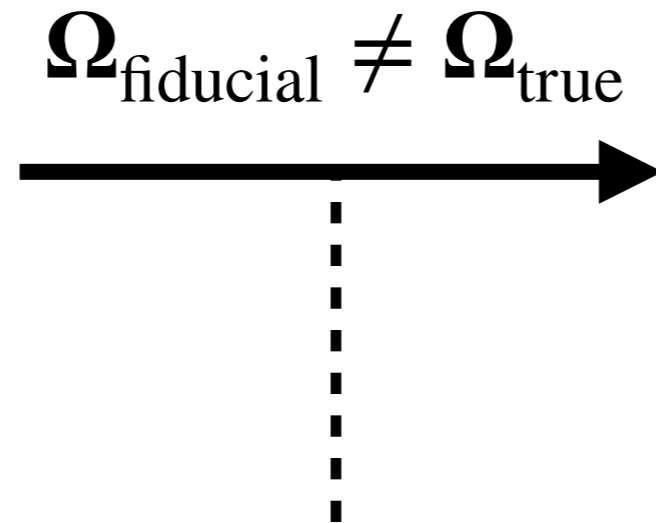
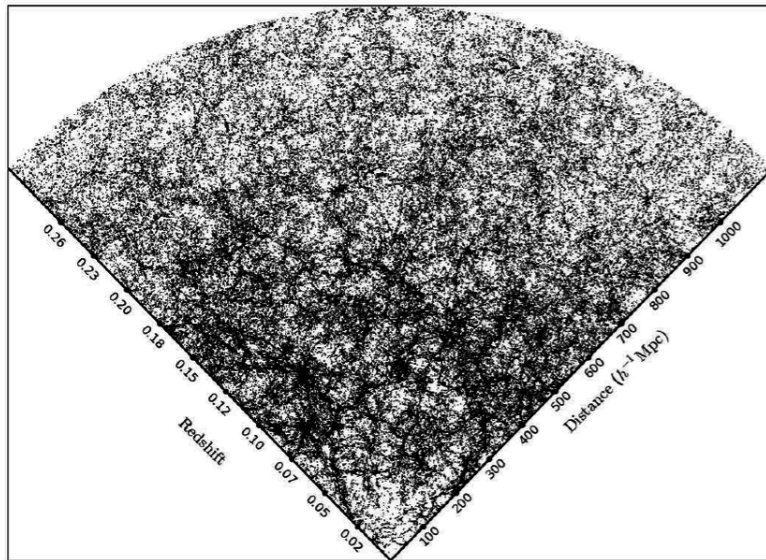
$$H(z, \Omega) = H_0 \sqrt{\Omega_m^0 (1+z)^3 + \Omega_\Lambda}$$

$$D_A(z, \Omega) = \frac{1}{1+z} \int_0^z \frac{cdz'}{H(z', \Omega)}$$

$$f(z, \Omega) = \frac{d \log D_{\text{lin}}(z, \Omega)}{d \log a(z)} = \Omega_m(z, \Omega)^\gamma$$

# Clustering of Tracers: What do we measure?

Galaxy Catalogue



Distortions **along** and **across** the line of sight

**Alcock-Paczynski effect**

**This effect distorts the homogeneity and isotropy of BAO as a function of  $\Omega_{\text{true}}$  &  $\Omega_{\text{fiducial}}$**



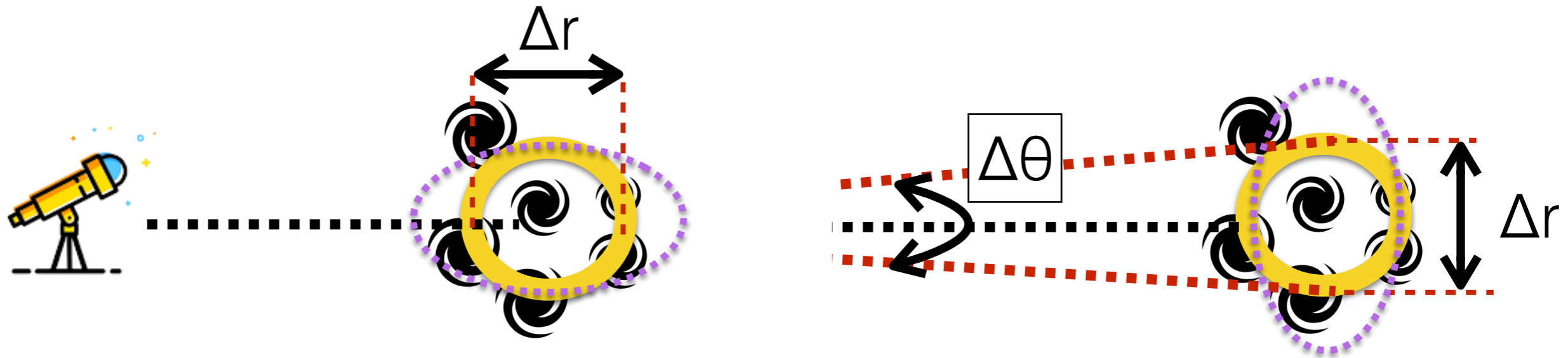
- Dark matter over-density,  $\delta(r) \equiv \frac{\rho(r)}{\bar{\rho}} - 1$   $\delta(k) = \int \delta(r) e^{ikr} dx$
- 2-point correlation function (2pCF),  $\langle \delta(r) \delta(r + R) \rangle = \xi(R)$
- Power Spectrum (PS)  $\langle \delta(k) \delta^*(k') \rangle = (2\pi)^3 P(k) \delta^D(k + k')$

The PS and 2pCF are the *observables* for RSD and BSO

$\delta$ -field is fully characterised by PS/2pCF if  $\delta$  is Gaussian

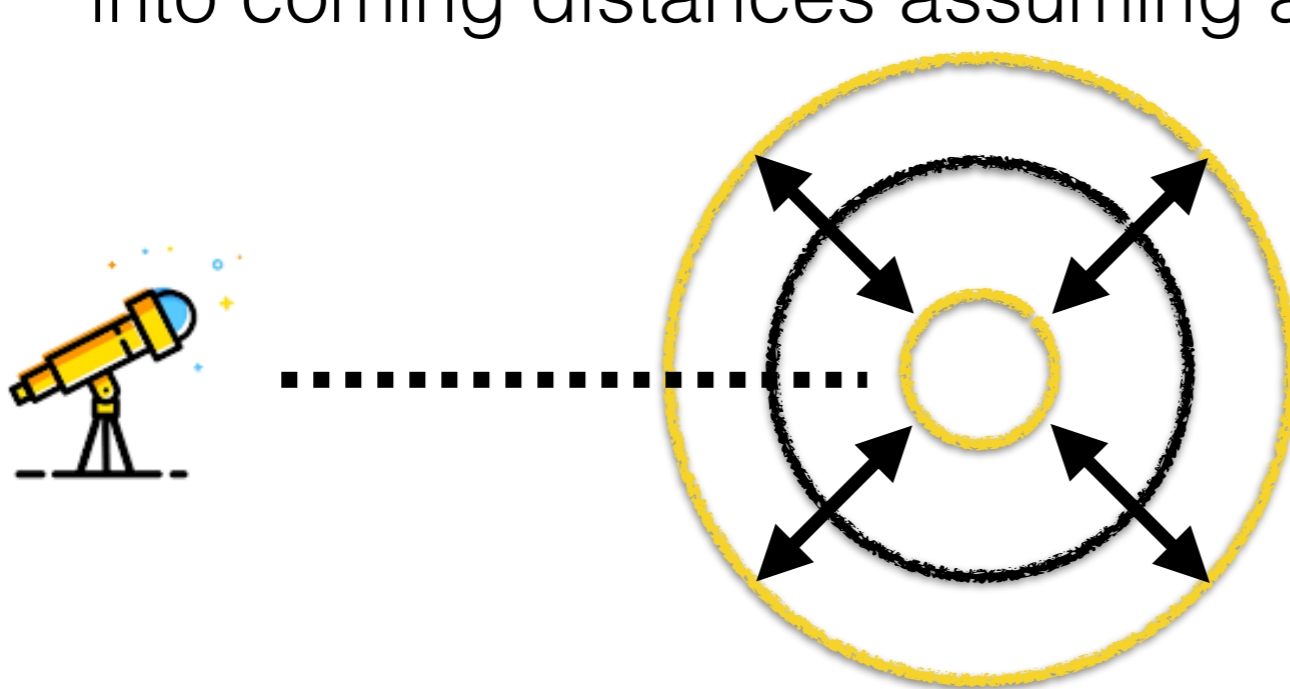
# Alcock-Paczynski & Redshift Space Distortions

- **AP effect:** Anisotropy induced by transforming redshifts into comoving distances assuming a wrong cosmology



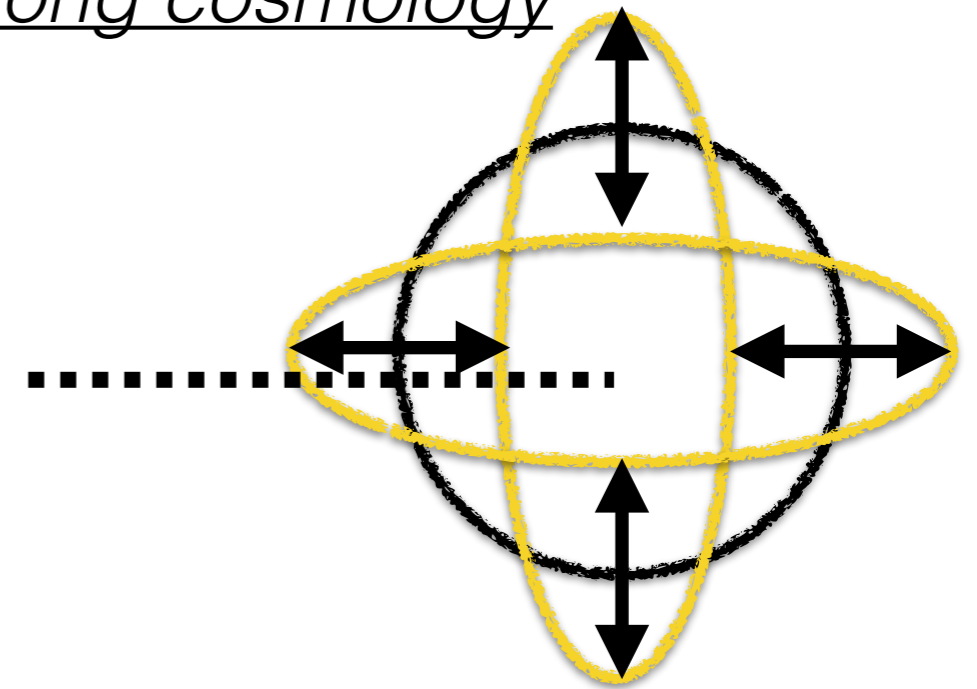
# Alcock-Paczynski & Redshift Space Distortions

- **AP effect:** Anisotropy induced by transforming redshifts into comoving distances assuming a wrong cosmology



BAO shift, but no  
extra anisotropy

$$\sim (D_A^2/H)^{1/3} / r_s$$



Relative BAO shift  
along and across  
the line-of-sight +  
induced anisotropy

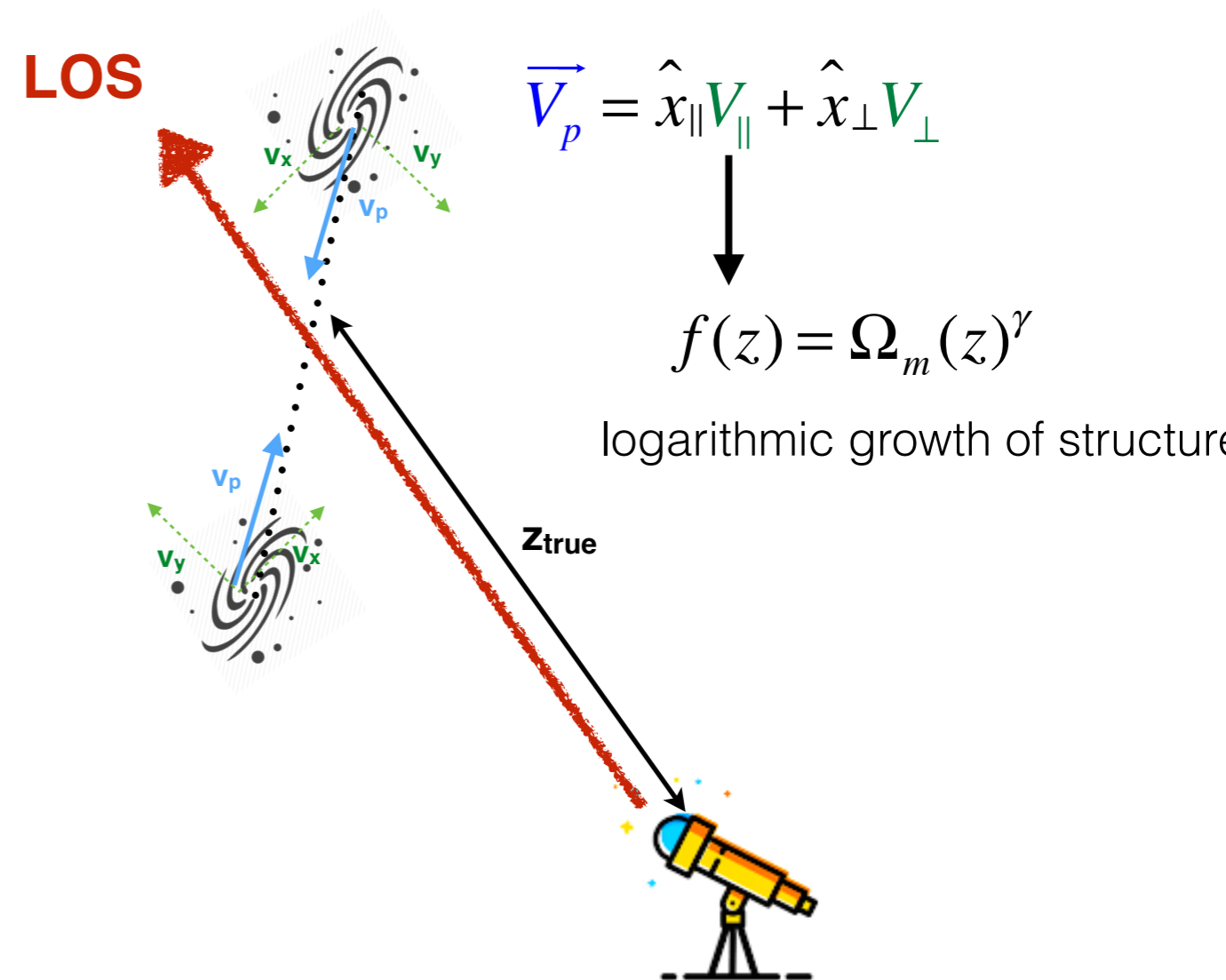
$$\sim D_A H$$

# Redshift Space Distortions

- Universe assumed **isotropic** and **homogeneous**
- **RSD**: Enhancement / reduction of the clustering along the line-of-sight (LOS) direction due to peculiar velocities (Kaiser 1987)

Induces anisotropy but does not shift the BAO

$$\sim f\sigma_8$$

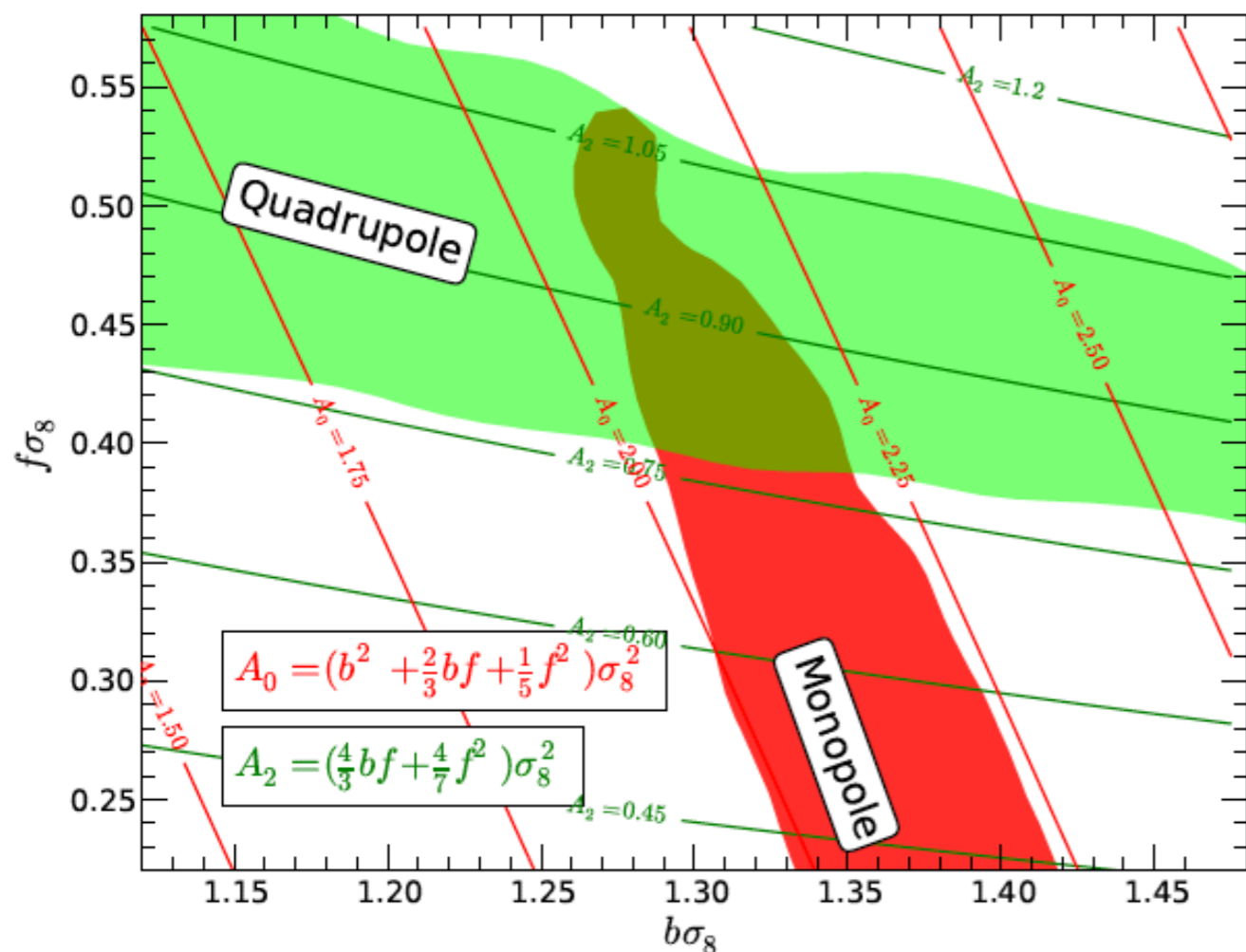


# Redshift Space Distortions

$$P_g^{(s)}(k, \mu) = [b + f\mu^2]^2 P_m(k) \longrightarrow \text{Measure } \mathbf{f}$$

$$P^{(s)}(k, \mu) = \underbrace{P^{(0)}(k)}_{\text{monopole}} L_0(\mu) + \underbrace{P^{(2)}(k)}_{\text{quadrupole}} L_2(\mu) + \underbrace{P^{(4)}(k)}_{\text{hexadecapole}} L_4(\mu)$$

(Samushia et al. 2013)



$$P^{(0)}(k) = (b^2 + \frac{2}{3}bf + \frac{1}{5}f^2) P_m(k)$$

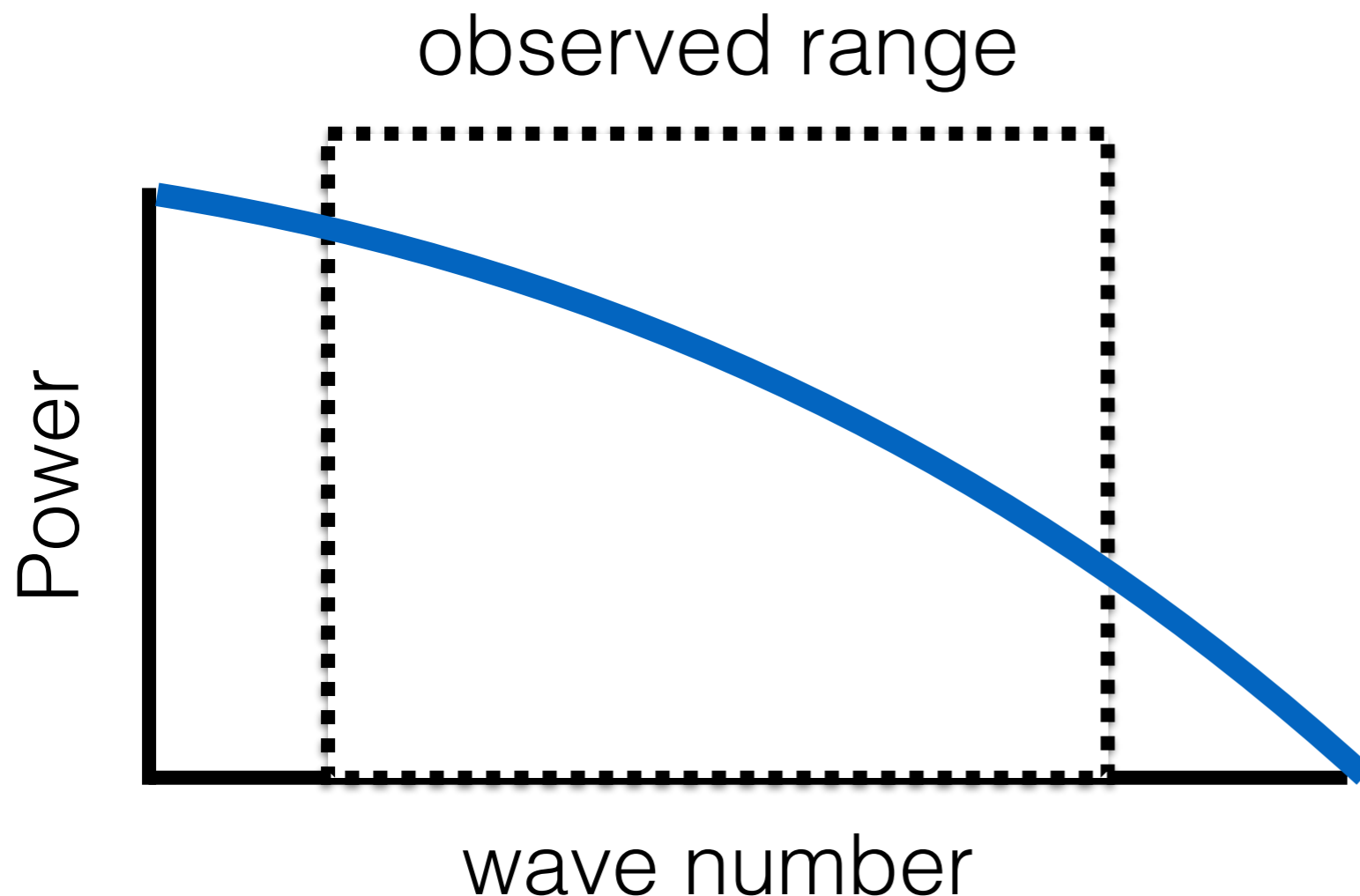
$$P^{(2)}(k) = (\frac{4}{3}bf + \frac{4}{7}f^2) P_m(k)$$

$$P^{(4)}(k) = (\frac{8}{35}f^2) P_m(k)$$

- Degeneration between  $f$  and  $b$  is broken when at least 2 multipoles are considered.
- In the limit  $f \longrightarrow 0$  we recover the expressions for no-RSD (isotropy)

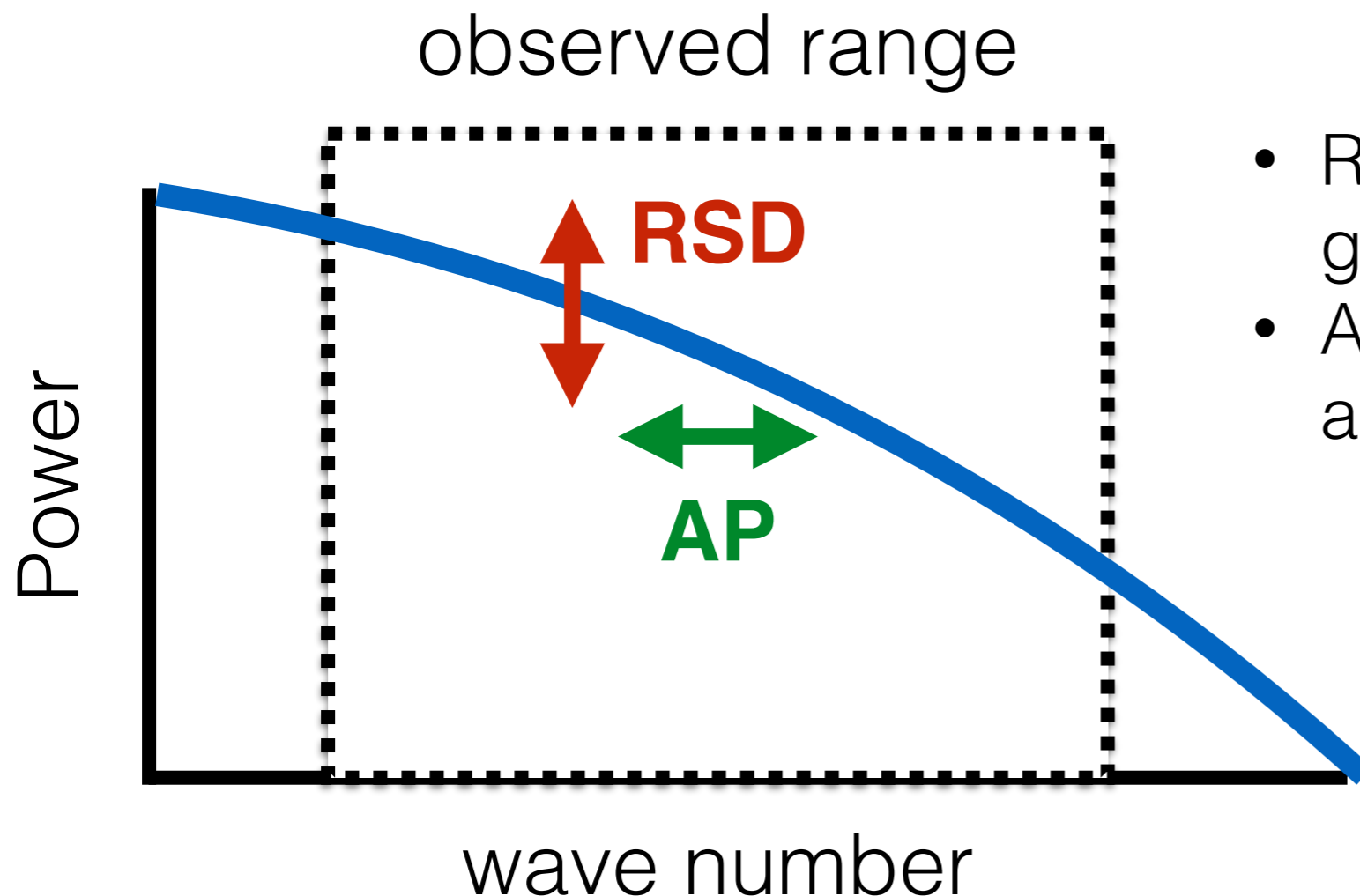
## BAO as standard ruler

- The sound horizon scale is well determined by CMB measurements (helps to calibrate)
- We can separate the effect of cosmological distortions (AP) from other effects such as RSD



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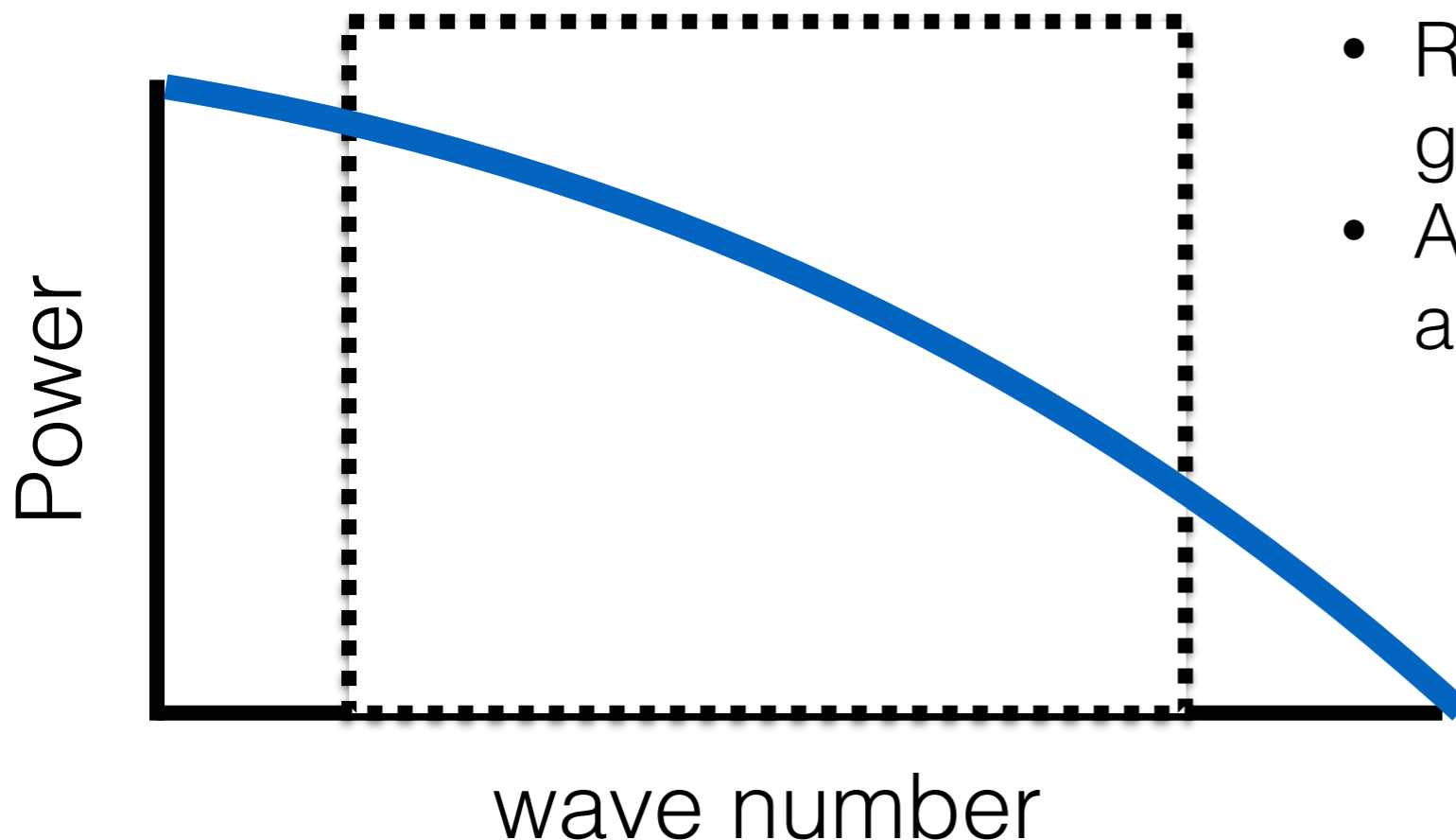


- RSD enhance the Power at a given scale
- AP shift the power of a scale to another scale

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observed range

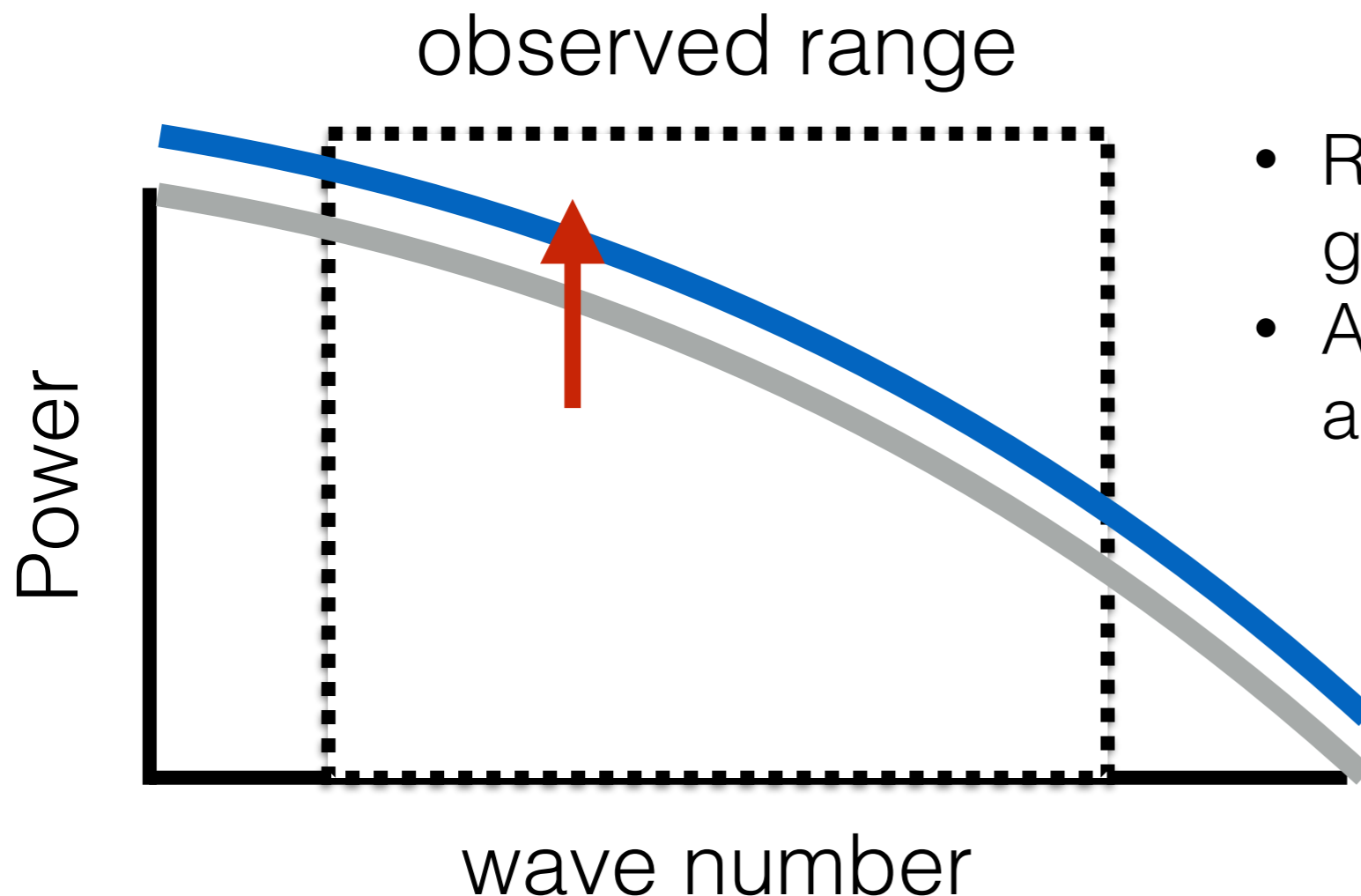


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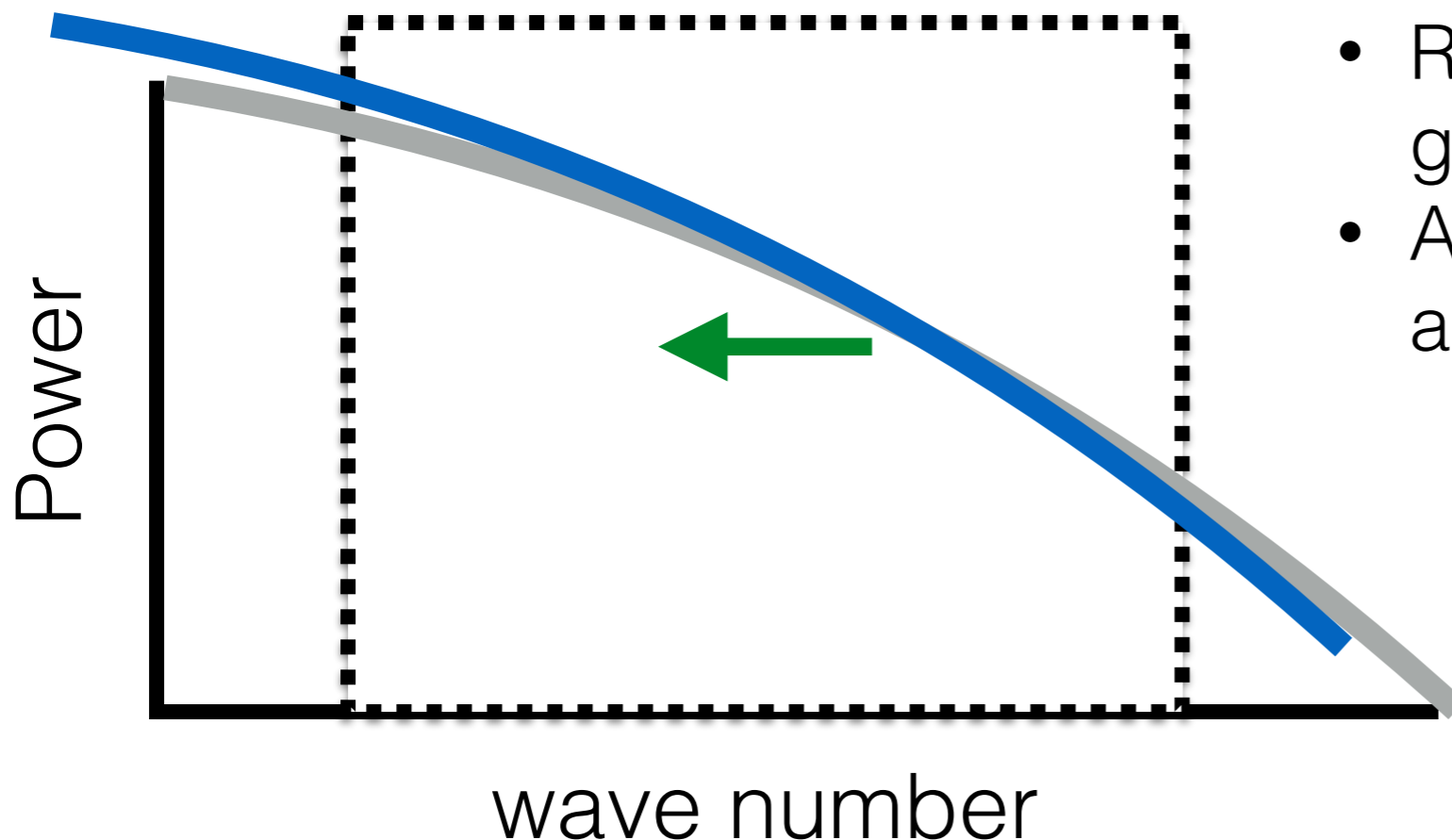


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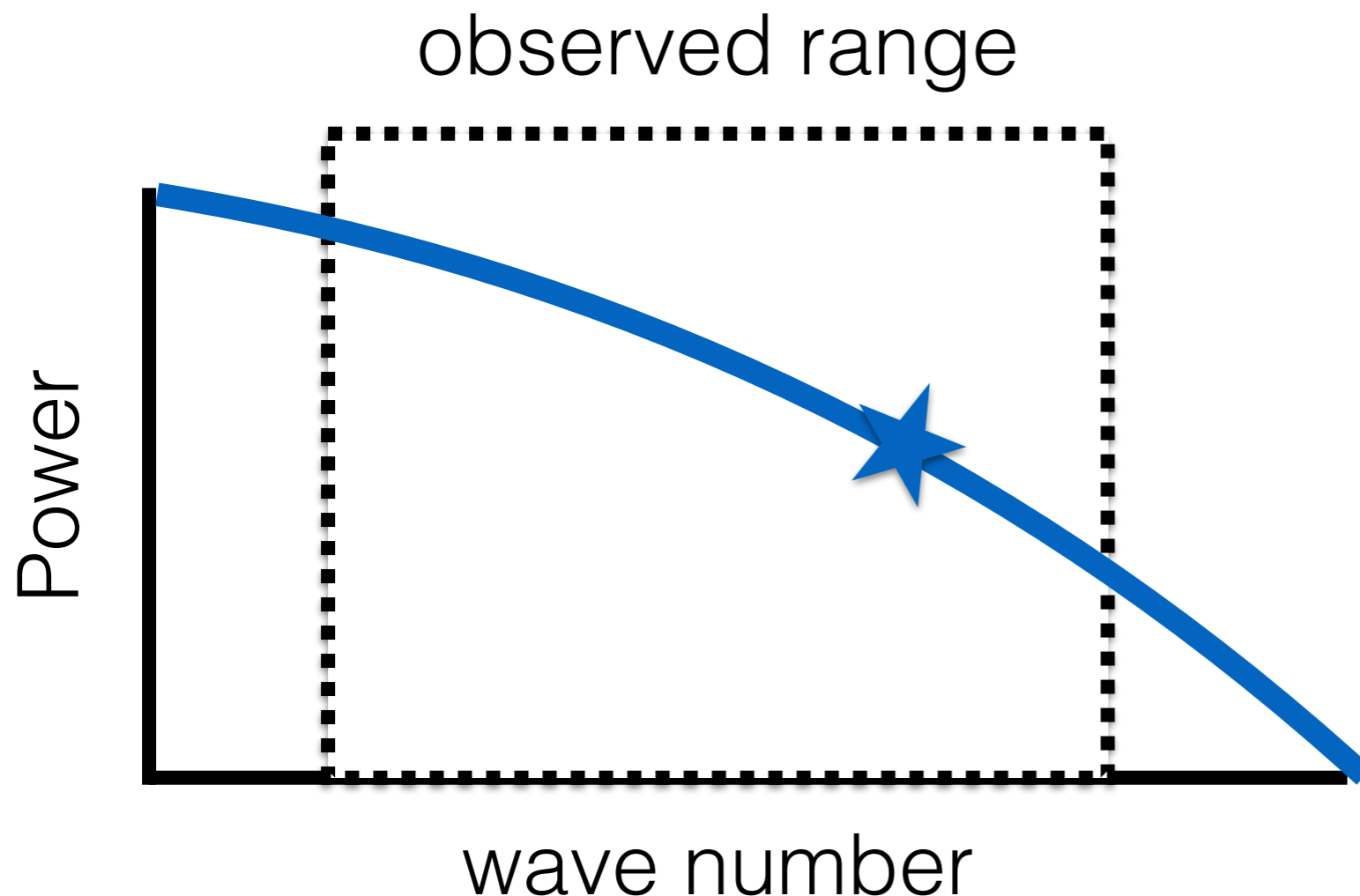


- RSD enhance the Power at a given scale
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Difficult to disentangle:  
RSD & AP

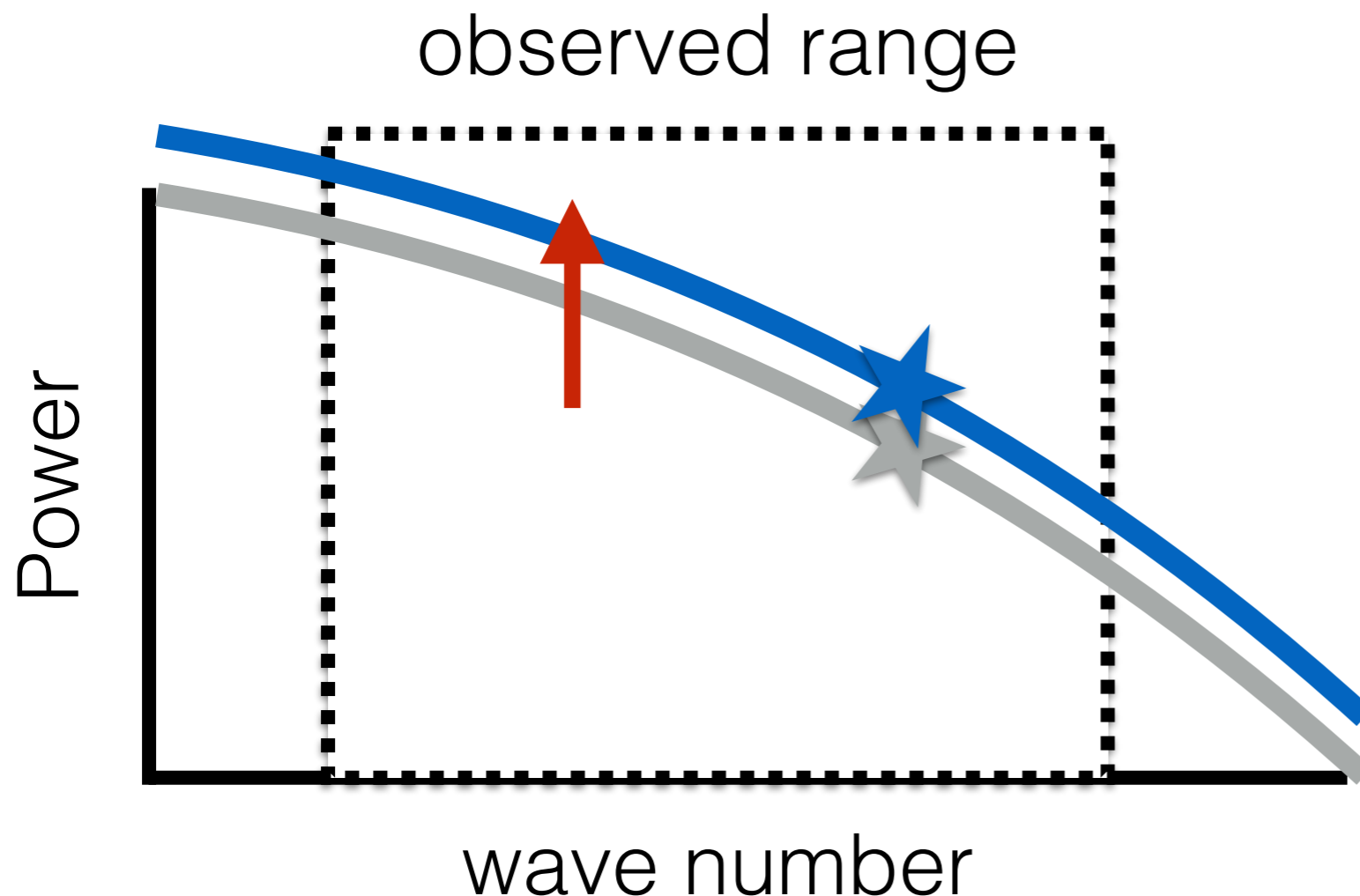
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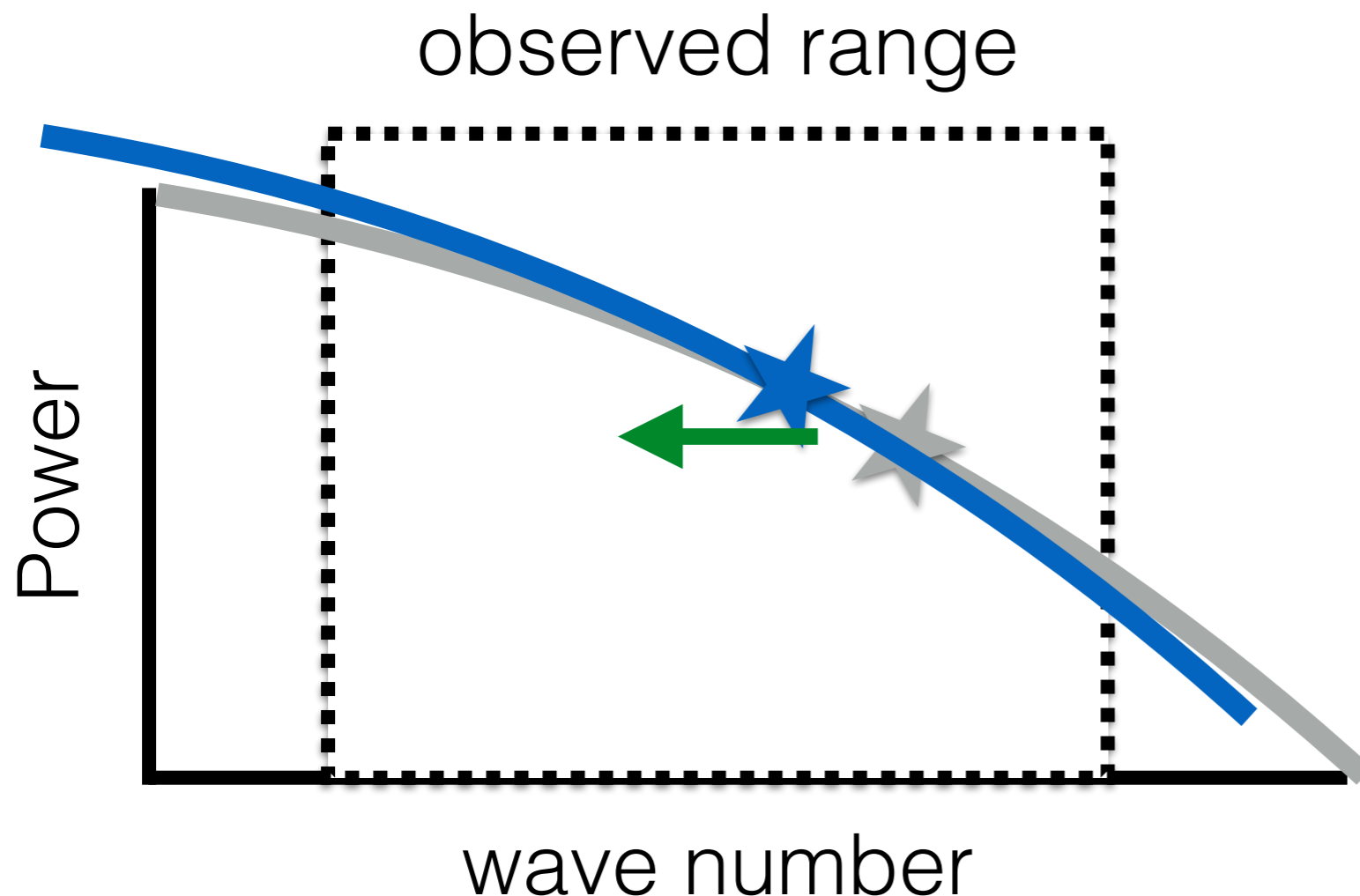
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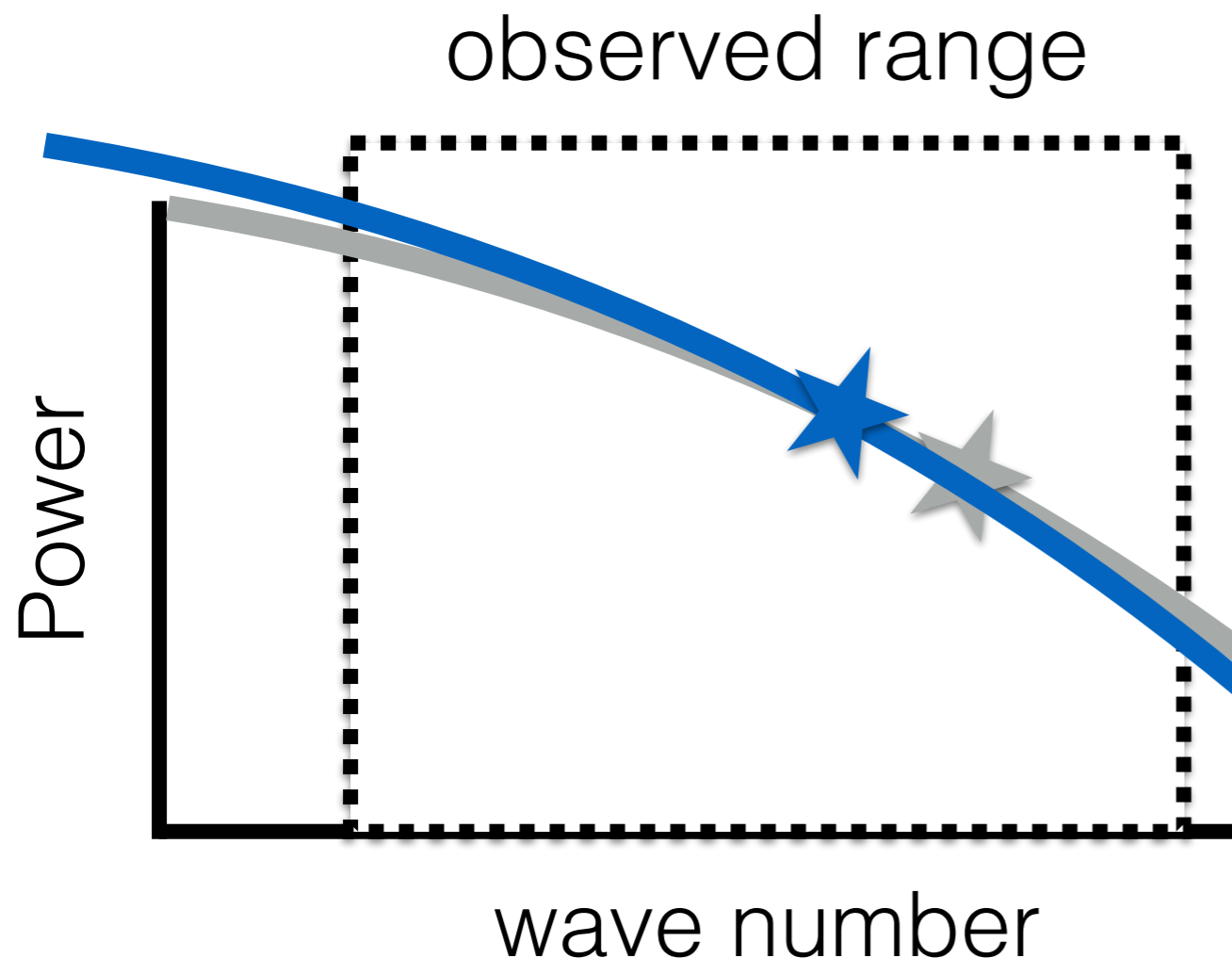
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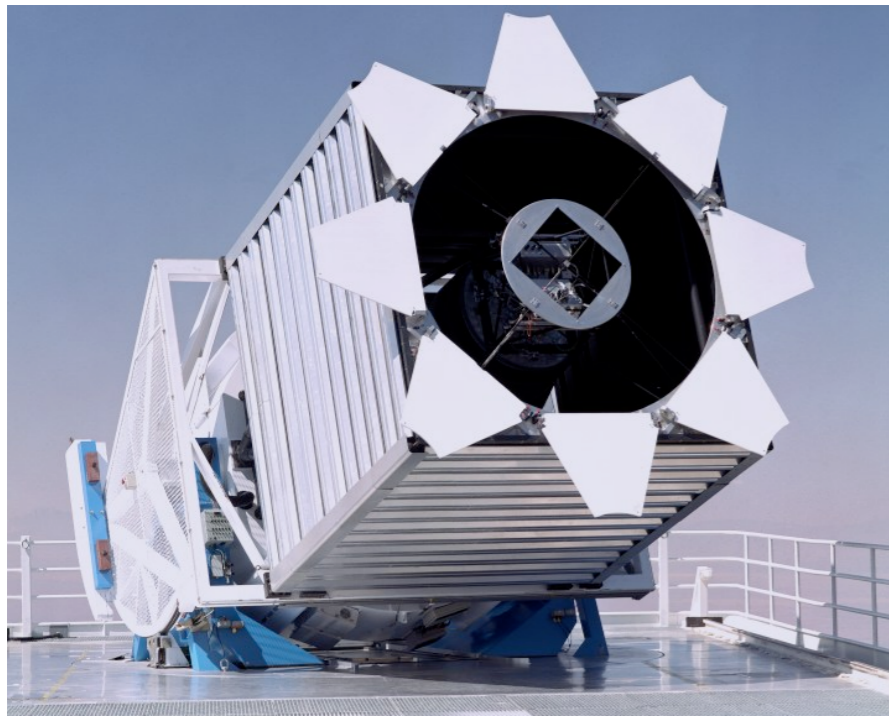
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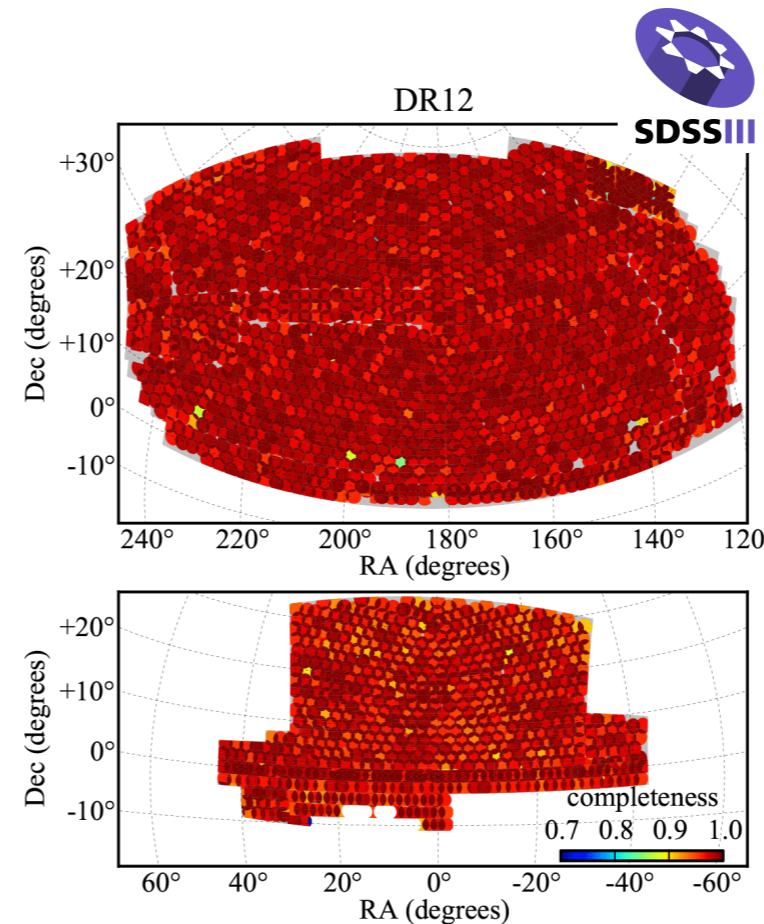
- BAO is the most distinct feature in  $\xi(s)$  and  $P(k)$  to look at.
- Position is robust under potential systematics:
- Non-linear effects are  $>1\%$
- BAO position not affected by bias or Kaiser boost
- However, the feature is damped by non-linear velocity bulks (can be solved using reconstruction)

# State of the art of measurements: BOSS & eBOSS



- APO, 2.5-meter Telescope
- Spectroscopic Galaxy Survey
- 2009 - 2014 BOSS: LRG+Lya
- 2014-2019 eBOSS: ELG, LRG, QSO+Lya

DR12 LRG



3 overlapping z-bins

$$0.2 < z < 0.5$$

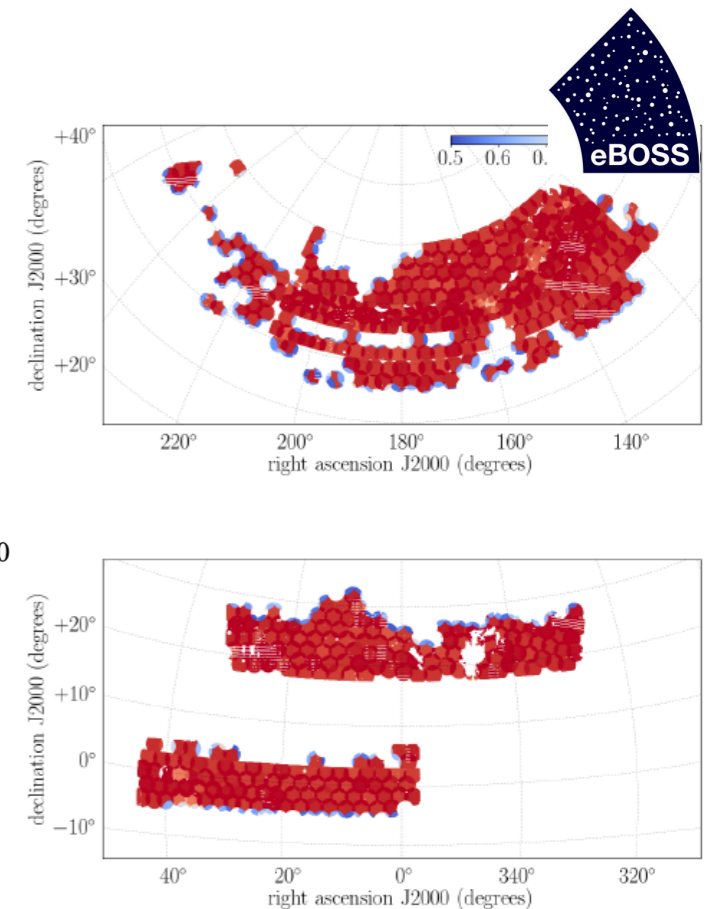
$$0.4 < z < 0.6$$

$$0.5 < z < 0.75$$

Area = 9376 deg<sup>2</sup>

~10<sup>6</sup> LRG targets

DR14 Quasars



$$0.8 < z < 2.2$$

Area = 2112.9 deg<sup>2</sup>  
~1.5 · 10<sup>5</sup> quasar targets

# Modelling the power spectrum: full shape vs. BAO

There are two main kind of complementary analyses:

1. **BAO analysis**: Based on the position of the BAO-peak
  - Constrain on  $D_A(z)$  and  $H(z)$  through the BAO-feature only
  - It only requires the modelling of the oscillation, not the shape/amplitude of the broadband signal
  - Usage of reconstruction algorithm to enhance the significance of the peak
2. **Full Shape analysis** (aka RSD): Based on the PS full shape and amplitude signal
  - Constrain the growth of structure,  $f\sigma_8(z)$ ,  $D_A(z)$  and  $H(z)$  through the shape and amplitude of a range of scales.
  - It requires a full modelling of the amplitude and shape of the power spectrum multipoles (and bispectrum)



# BAO Analysis

- Reconstruction suppresses RSD & non-linearities
- Quadrupole is close to be 0
- Work with monopole and  $\mu^2$ -moment

$$P^{(\mu^2)} \equiv \frac{2}{5} P^{(2)} + P^{(0)}$$

- BAO-peak position,  $\alpha$ , is related to AP-dilation parameters,

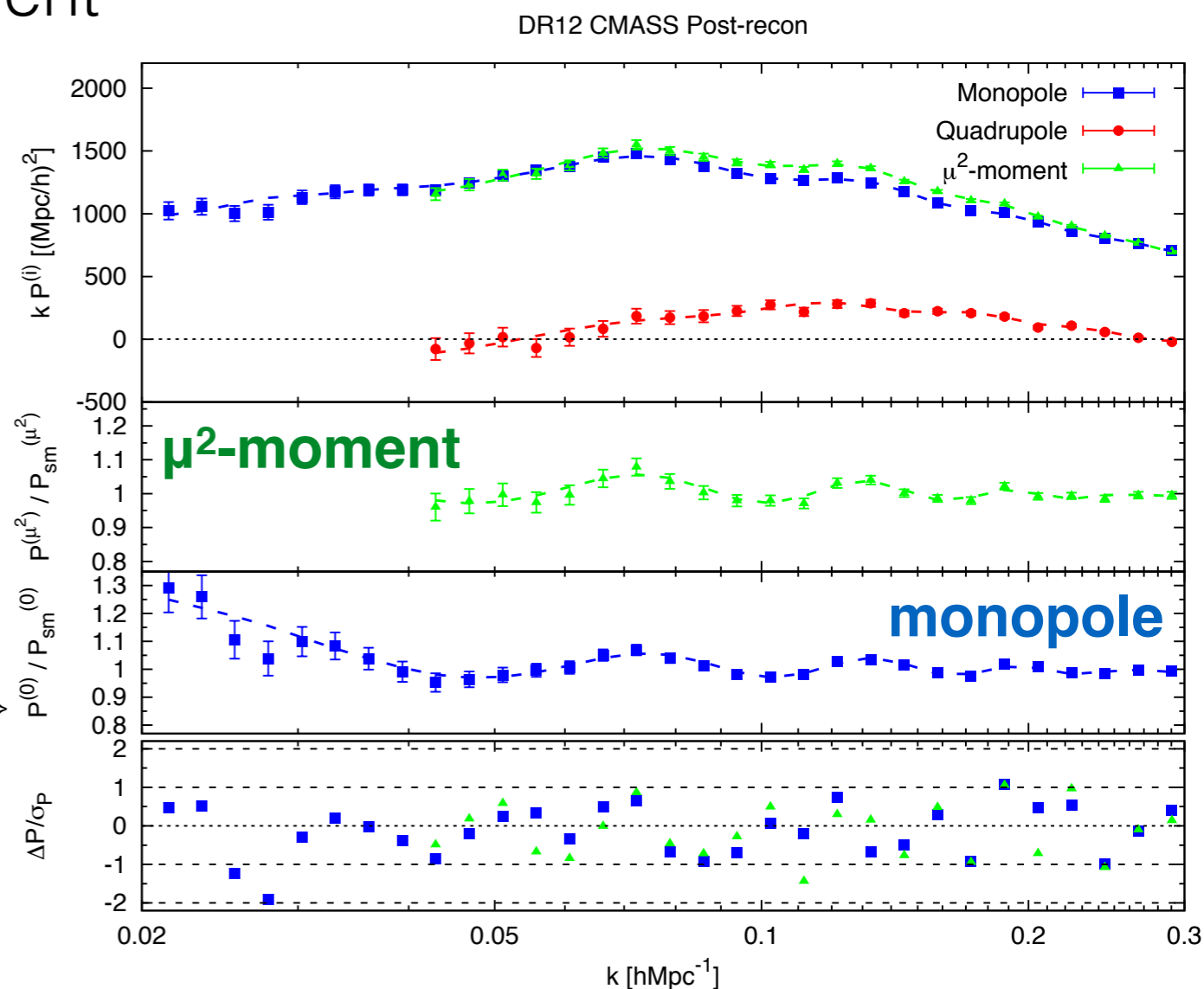
$$\alpha_{\parallel} = \alpha_0^{-3/2} \alpha_2^{5/2} \quad \alpha_{\perp} = \alpha_0^{9/4} \alpha_2^{-5/4}$$

$$P_{bao}(k, \alpha_{0,2}) = P_{sm}(k) \left\{ 1 + \left[ O_{lin}(k / \alpha_{0,2}) - 1 \right] e^{-\frac{1}{2} k^2 \Sigma_{nl}^2} \right\}$$

where,

$$P_{sm}(k) = B^2 P_{lin,sm}(k) + A_1 k + A_2 + \frac{A_3}{k} + \dots$$

models the broadband



# Full Shape Analysis

- Non-linear dark matter PS shape

## Perturbation Theory 2-loop

- Galaxy bias,

## Non-linear & non-local

- Redshift Space distortions

## TNS-model

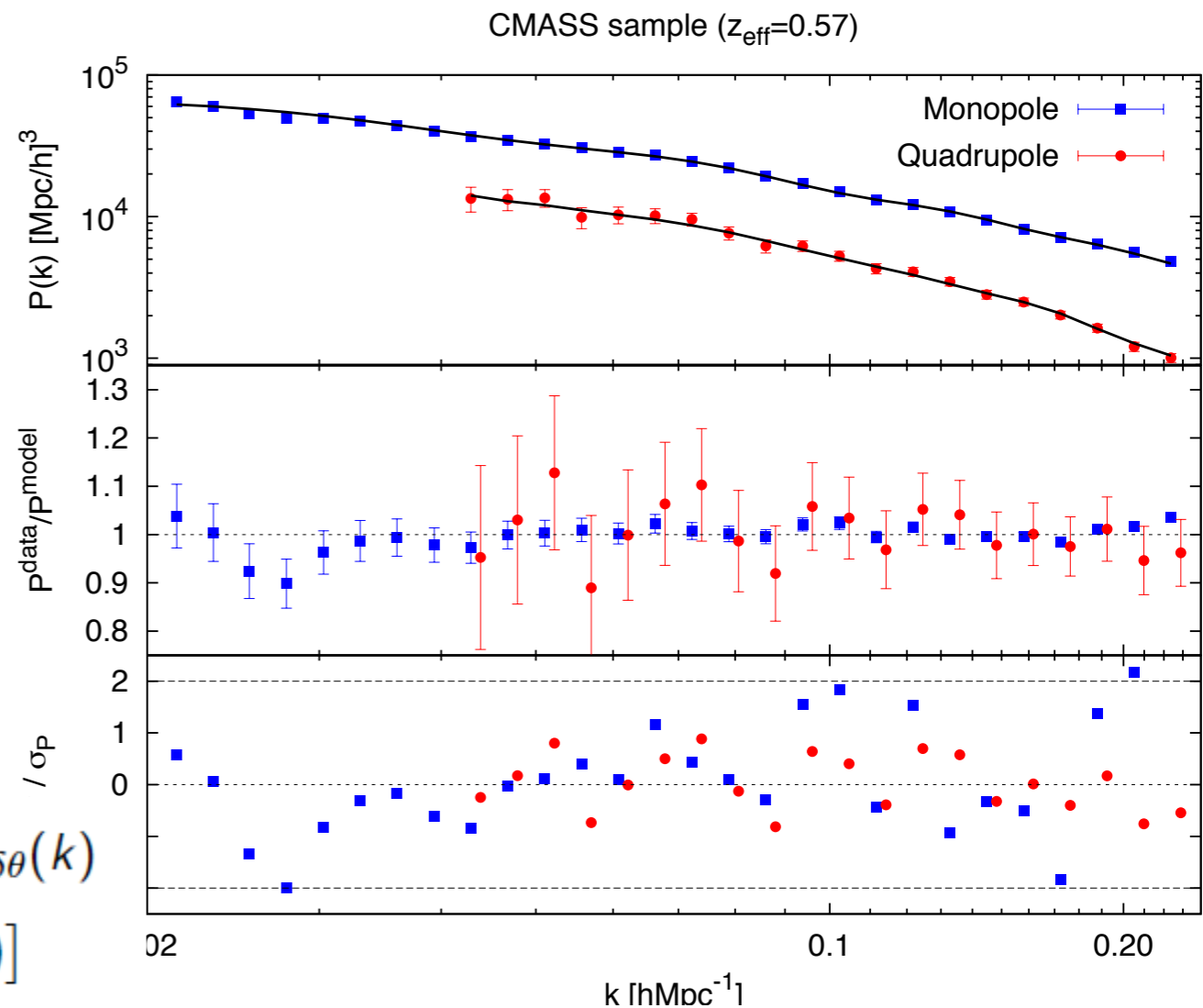
$$P_g^{(s)}(k, \mu) = D_{\text{FoG}}^P(k, \mu, \sigma_{\text{FoG}}^P[z]) [P_{g,\delta\delta}(k) + 2f\mu^2 P_{g,\delta\theta}(k) + f^2\mu^4 P_{\theta\theta}(k) + b_1^3 A(k, \mu, f/b_1) + b_1^4 B(k, \mu, f/b_1)]$$

$P_{\delta\delta}, P_{\delta\theta}, P_{\theta\theta} \rightarrow$  Dark Matter non-linear models  
 $D_{\text{FoG}}^P \rightarrow$  1-parameter Lorentzian damping term  
 $A, B \rightarrow$  TNS functions

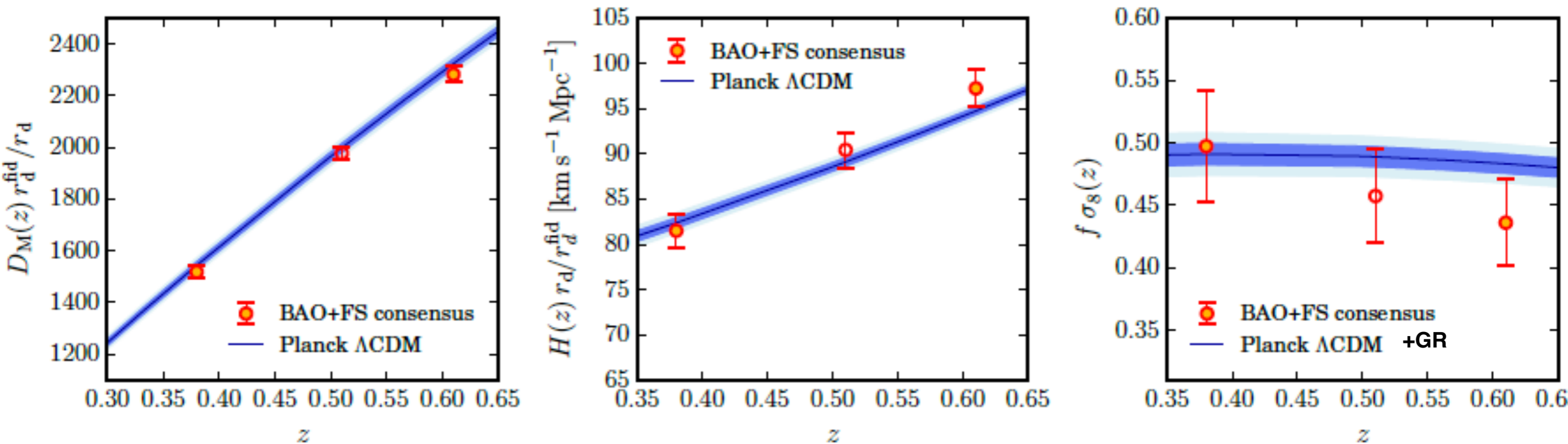
The total number of free parameters of the model is,

- Bias Parameters:  $b_1, b_2$
- **Cosmology Parameters:**  $f, \sigma_8$
- **AP parameters:**  $\alpha_{\parallel}, \alpha_{\perp} \rightarrow D_A/r_s(z_d)$  and  $H(z)r_s(z_d)$
- Fingers-of-God:  $\sigma_{\text{FoG}}$
- Shot noise amplitude  $A_{\text{Noise}}$

8 free parameters  $\rightarrow$  4 cosmological, 4 “nuisance”



# Main BOSS results from PS/CF FS+BAO



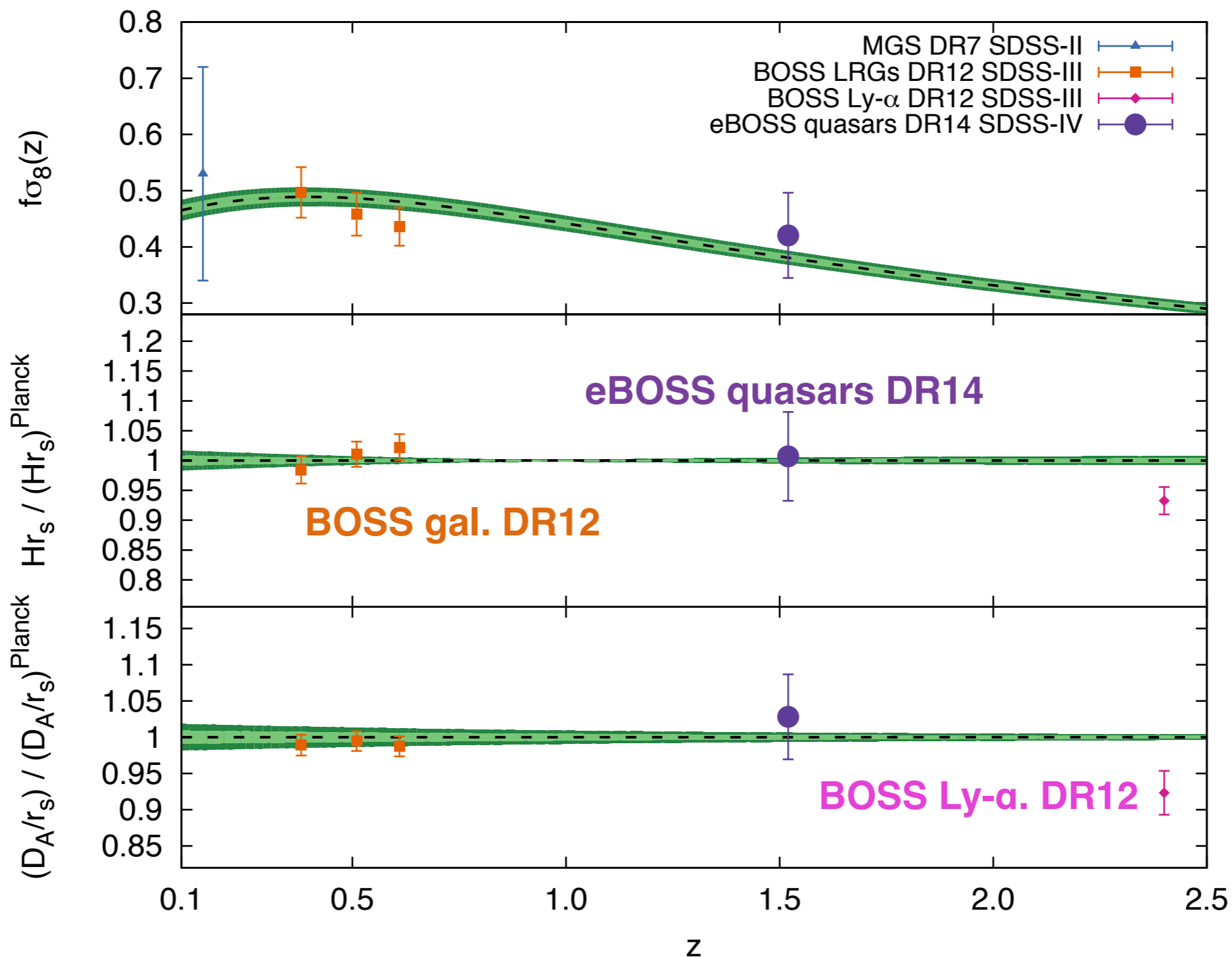
*Alam et al. 2016*

- Good Agreement with Planck+GR
- First time 1% precision BAO measurement

3 overlapping z-bins

**0.2 < z < 0.5**  
**0.4 < z < 0.6**  
**0.5 < z < 0.75**

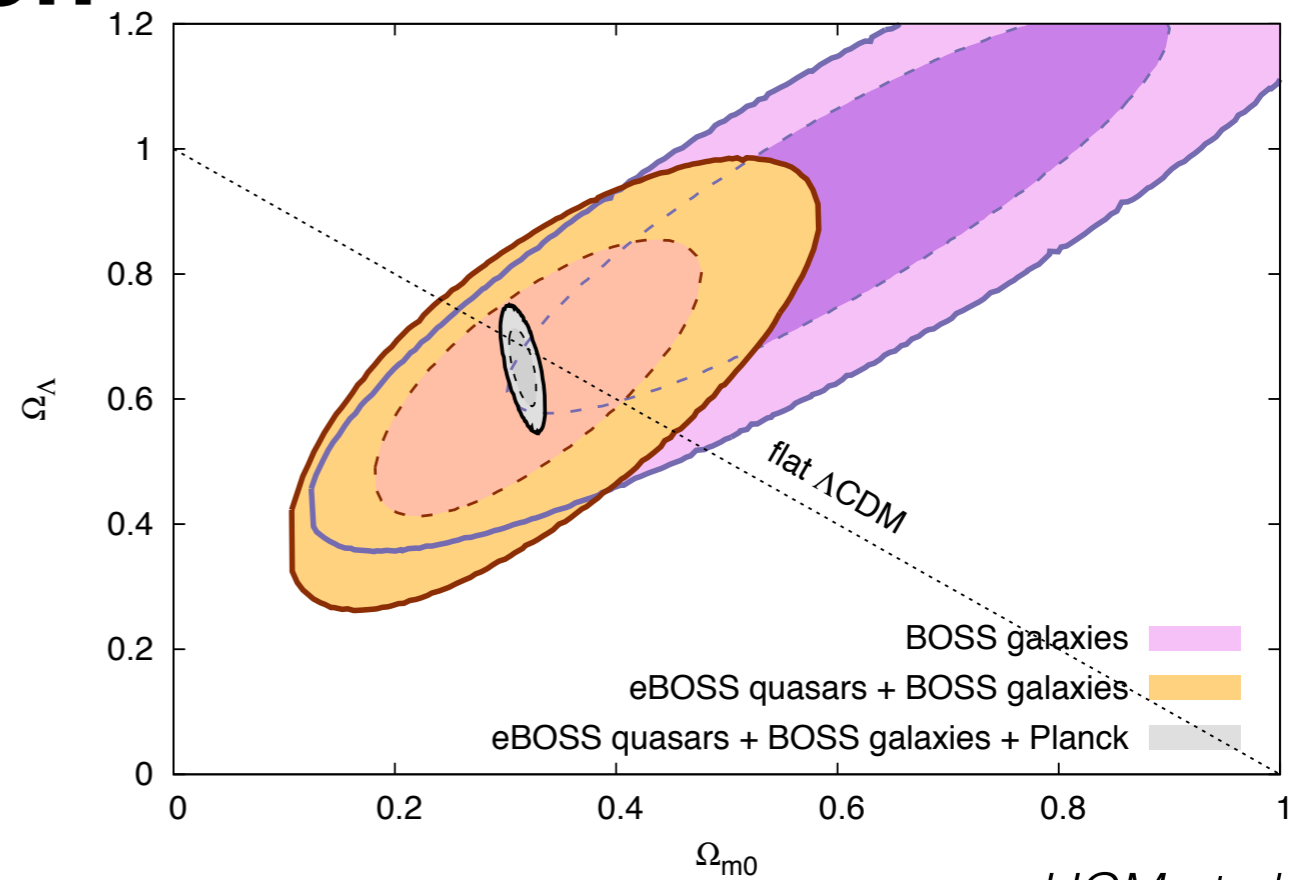
# Main BOSS+eBOSS quasars



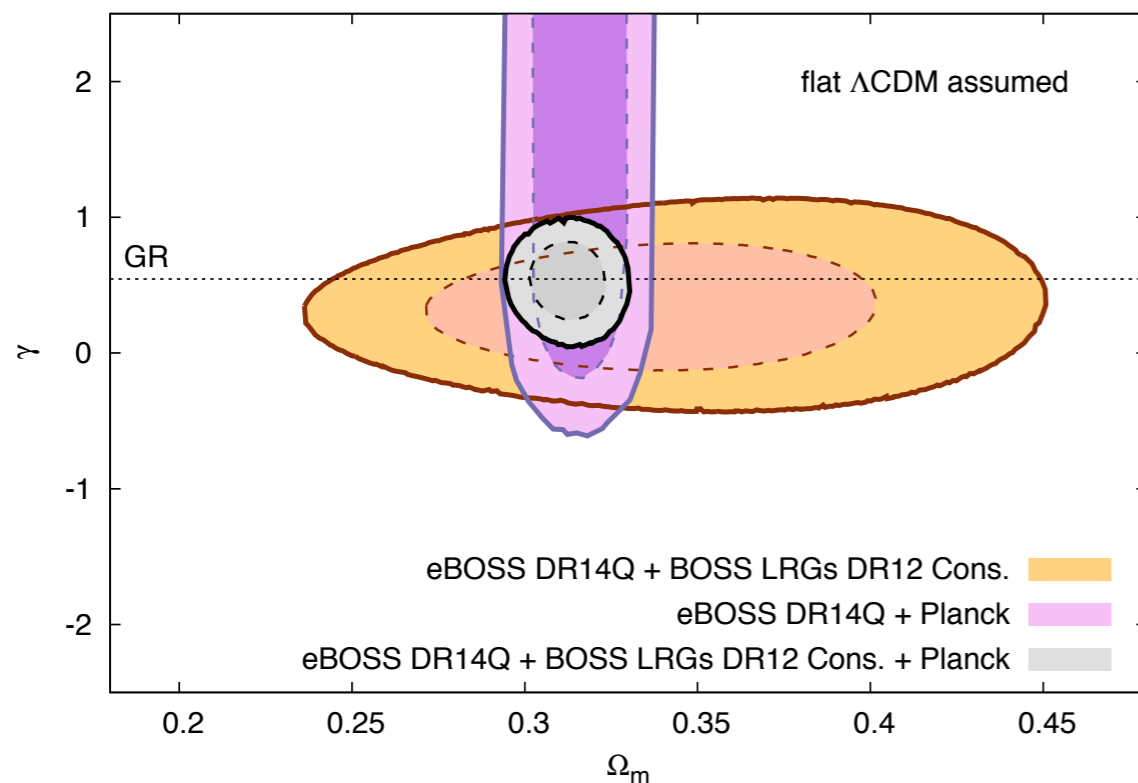
# Cosmology Interpretation

## GR & $\Lambda$ CDM assumed

$D_A(z)$ ,  $H(z)$ ,  $f\sigma_8(z)$  from BOSS galaxies / eBOSS quasars



*HGM et al. 2018*



## flat $\Lambda$ CDM assumed

$D_A(z)$ ,  $H(z)$ ,  $f\sigma_8(z)$  from BOSS galaxies / eBOSS quasars

# Beyond the 2-point statistics

- Quantity which is essentially non-linear

If all the  $\delta(\mathbf{k})$  modes evolve linearly (and the initial conditions are Gaussian) the bispectrum is 0 and all the information on the system of objects/galaxies is described by the power spectrum.

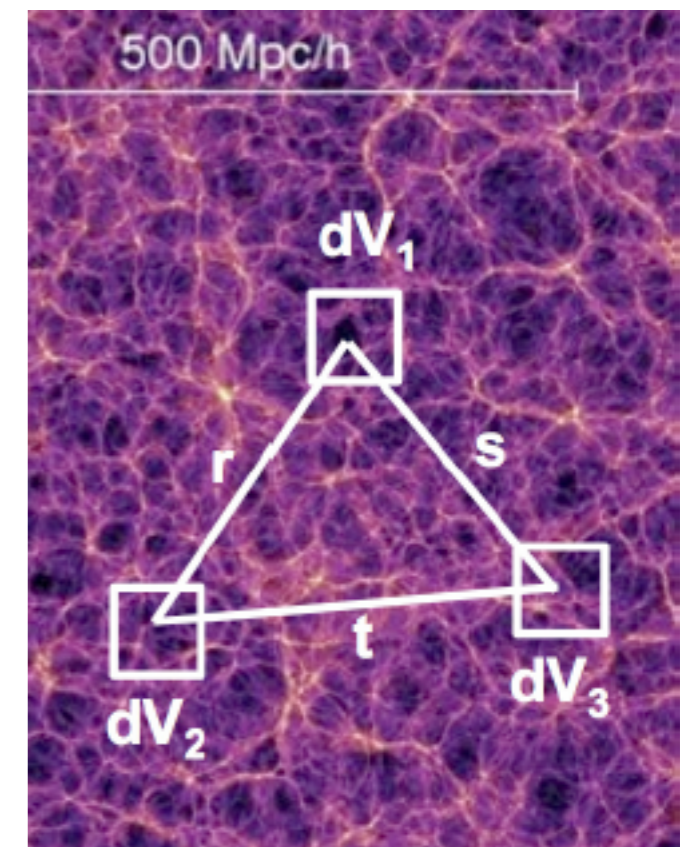
Probability of finding 3 galaxies separated by  $r$ ,  $s$

and  $t$ :  $P_3(r, s, t) =$

$[1 + \xi_2(r) + \xi_2(s) + \xi_2(t) + \zeta(r, s, t)] dV_1 dV_2 dV_3$

The bispectrum is defined as the FT of  $\zeta$ ,

$$B(\mathbf{k}_1, \mathbf{k}_2) \equiv \int d\mathbf{r} d\mathbf{s} \zeta(\mathbf{r}, \mathbf{s}) e^{-i\mathbf{r}\cdot\mathbf{k}_1} e^{-i\mathbf{s}\cdot\mathbf{k}_2}$$



# Beyond the 2-point statistics

- Definition

$$\delta(x) \equiv \frac{\rho(x) - \bar{\rho}}{\bar{\rho}} \xrightarrow{FT} \delta_k$$

$$\langle \delta_{k_1} \delta_{k_2} \delta_{k_3} \rangle = (2\pi)^3 B(k_1, k_2) \delta^D(k_1 + k_2 + k_3)$$

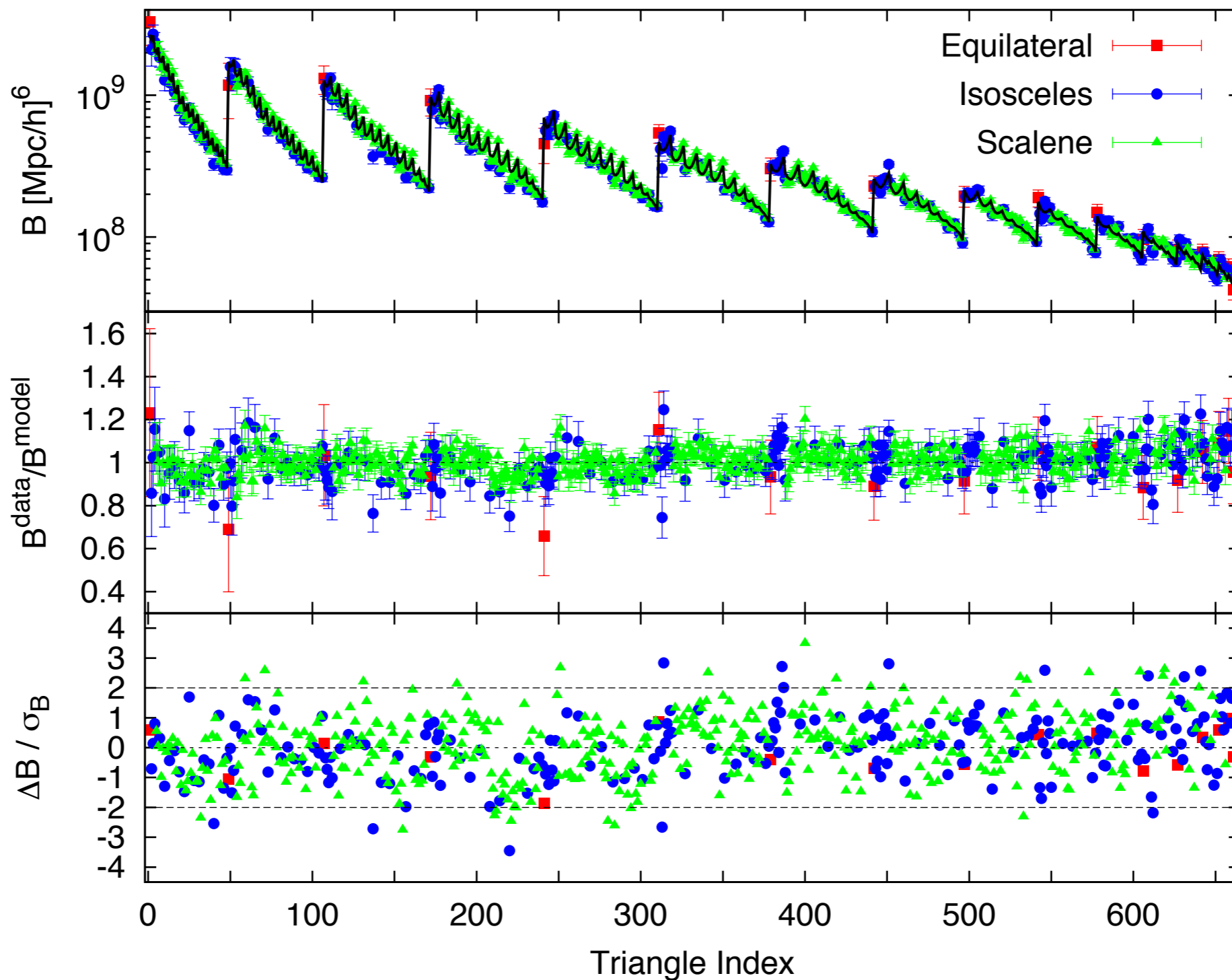
- Potential usage

## Bispectrum is 0 when $\delta$ is a Gaussian field

- Mode-coupling leak BAO & RSD information from P into B, T, ...
- Reconstruction 'Gaussianizes'  $\delta$  and partially solve this issue (but assumes  $\Omega_m$  and need high density of tracers).
- B can break degeneracy between  $\mathbf{f}$  and  $\sigma_8$  in RSD analyses when P(k) is used.
- Primordial non-Gaussian signal in P and B
- Modified-GR signal inside F-kernels (first order B)

# Measurement BOSS LRGs $0.43 < z < 0.70$

CMASS sample ( $z_{\text{eff}}=0.57$ )





# Modelling the Bispectrum (1st order)

- Real Space,

$$B_g(\vec{k}_1, \vec{k}_2) = b_1^4 \sigma_8^4 \left\{ 2P_{lin}(k_1)P_{lin}(k_2) \left[ \frac{1}{b_1} F_2^{(s)}(\vec{k}_1, \vec{k}_2) + \frac{b_2}{2b_1^2} + \frac{2}{7b_1^2} (1-b_1) S_2(\vec{k}_1, \vec{k}_2) \right] + cyc. \right\}$$

$$F_2^{(s)}(\vec{k}_i, \vec{k}_j) = \frac{5}{7} + \frac{1}{2} \cos(\alpha_{ij}) \left[ \frac{k_i}{k_j} + \frac{k_j}{k_i} \right] + \frac{2}{7} \cos^2(\alpha_{ij})$$

- Redshift Space

$$B_g^{(s)}(\vec{k}_1, \vec{k}_2) = \sigma_8^4 \left[ 2P_{lin}(k_1)P_{lin}(k_2)Z_1(\vec{k}_1)Z_1(\vec{k}_2)Z_2^{(s)}(\vec{k}_1, \vec{k}_2) + cyc. \right]$$

$$Z_1(\vec{k}) = (b_1 + f\mu^2)$$

$$Z_2(\vec{k}_i, \vec{k}_j) = b_1 \left[ F_2(\vec{k}_1, \vec{k}_2) + \frac{f\mu k}{2} \left( \frac{\mu_1}{k_1} + \frac{\mu_2}{k_2} \right) \right] + f\mu^2 G_2(\vec{k}_1, \vec{k}_2) + \frac{f^3 \mu k}{2} \mu_1 \mu_2 \left( \frac{\mu_2}{k_1} + \frac{\mu_1}{k_2} \right) + \frac{b_2}{2} + \frac{2}{7} (1-b_1) S_2(\vec{k}_1, \vec{k}_2)$$

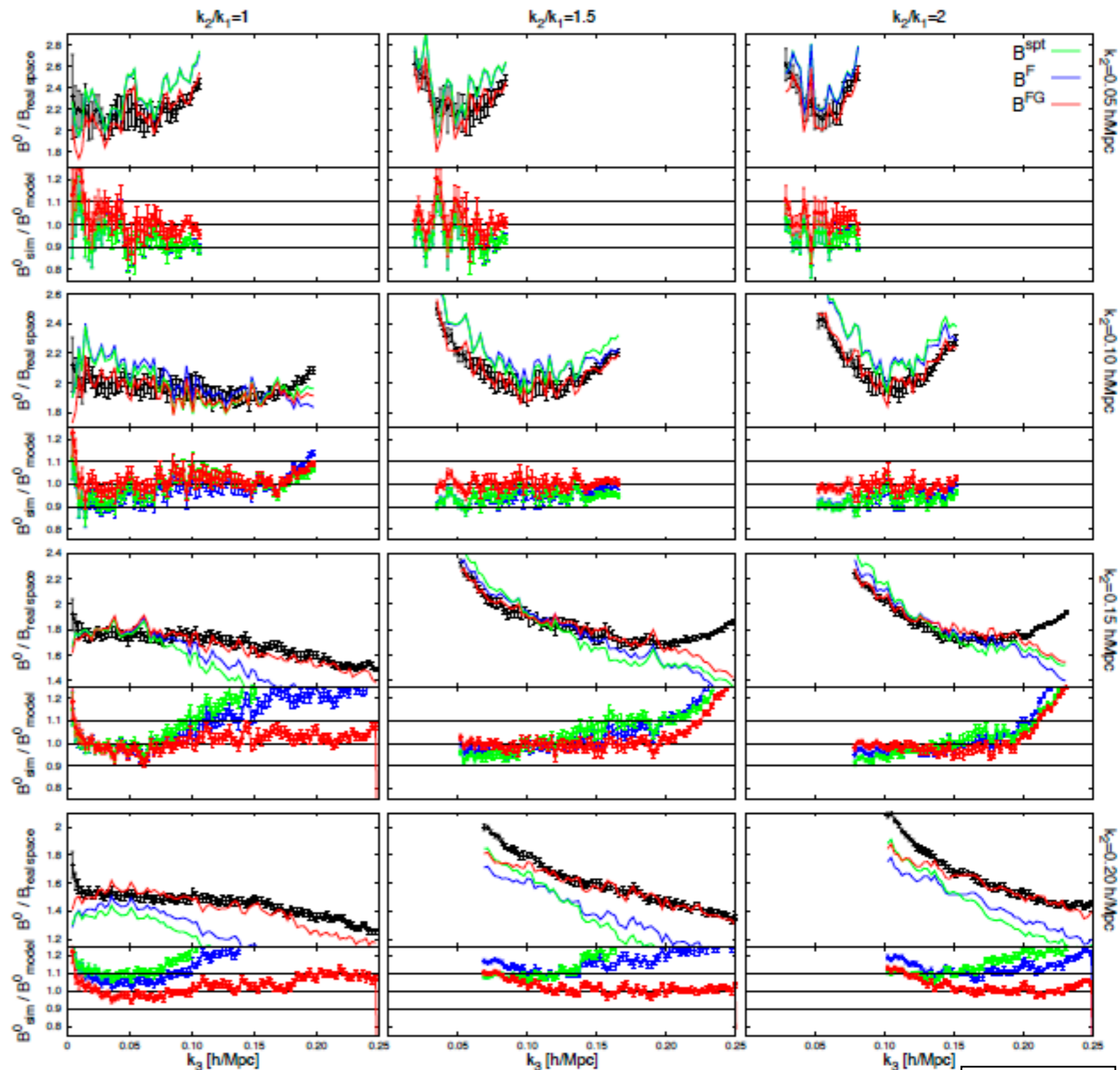
- Tree level only provides an accurate description at high redshift and large scales

- Empirical improvement of this formula through effective kernels method

$$F_2 \rightarrow F_2^{eff} \quad \text{HGM et al 2012}$$

$$G_2 \rightarrow G_2^{eff} \quad \text{HGM et al. 2014}$$

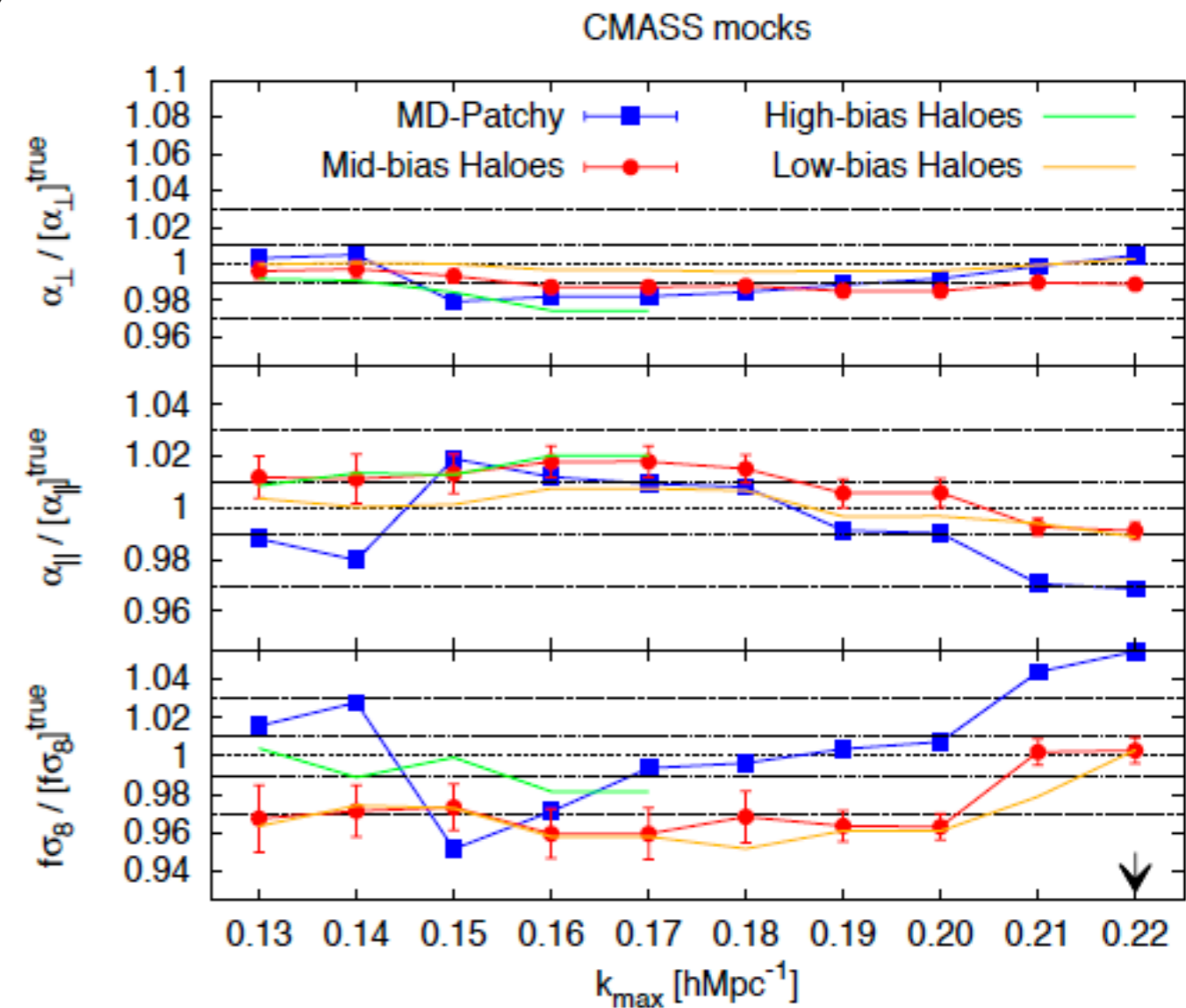
- 9 free parameters each kernel to be fitted from dark matter N-body simulations. Independent of scales/redshift



$z=0.5$

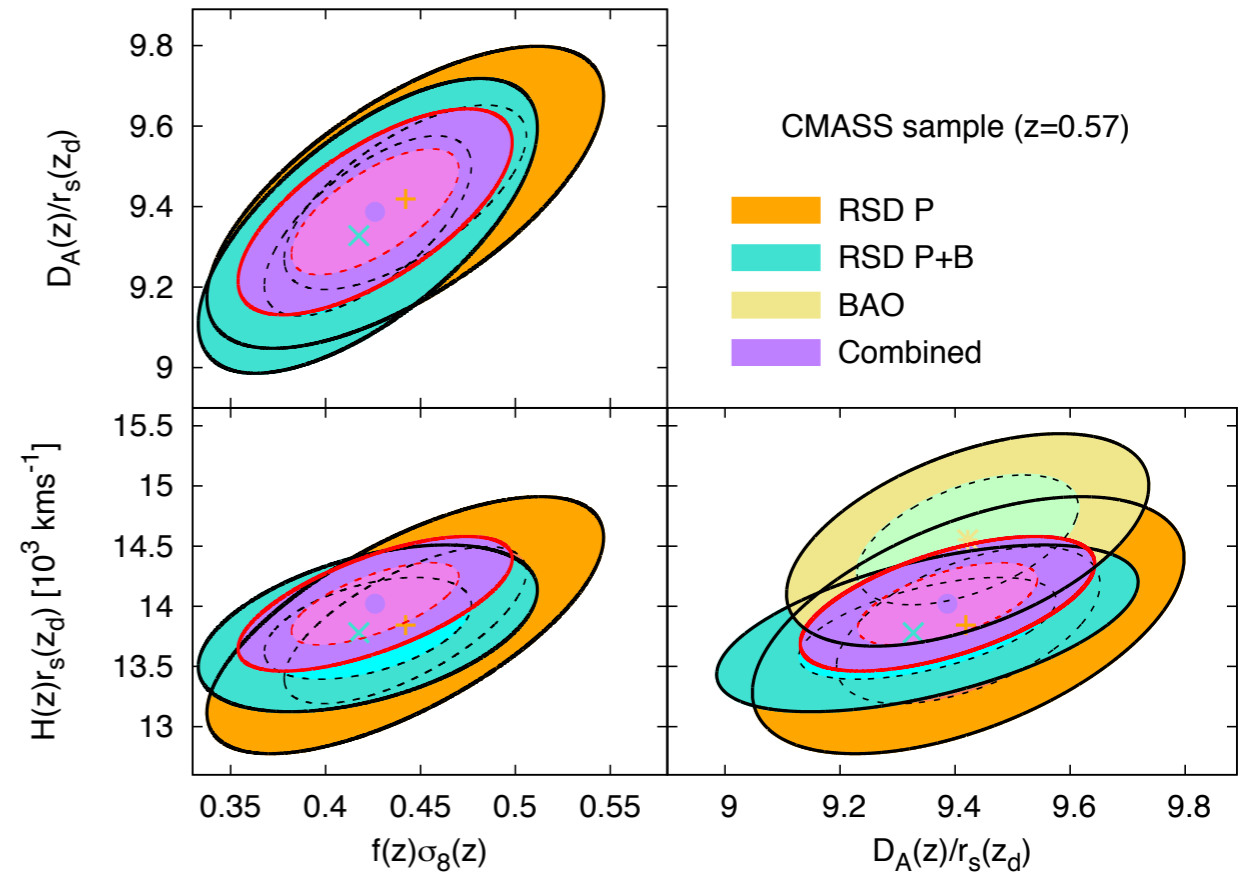
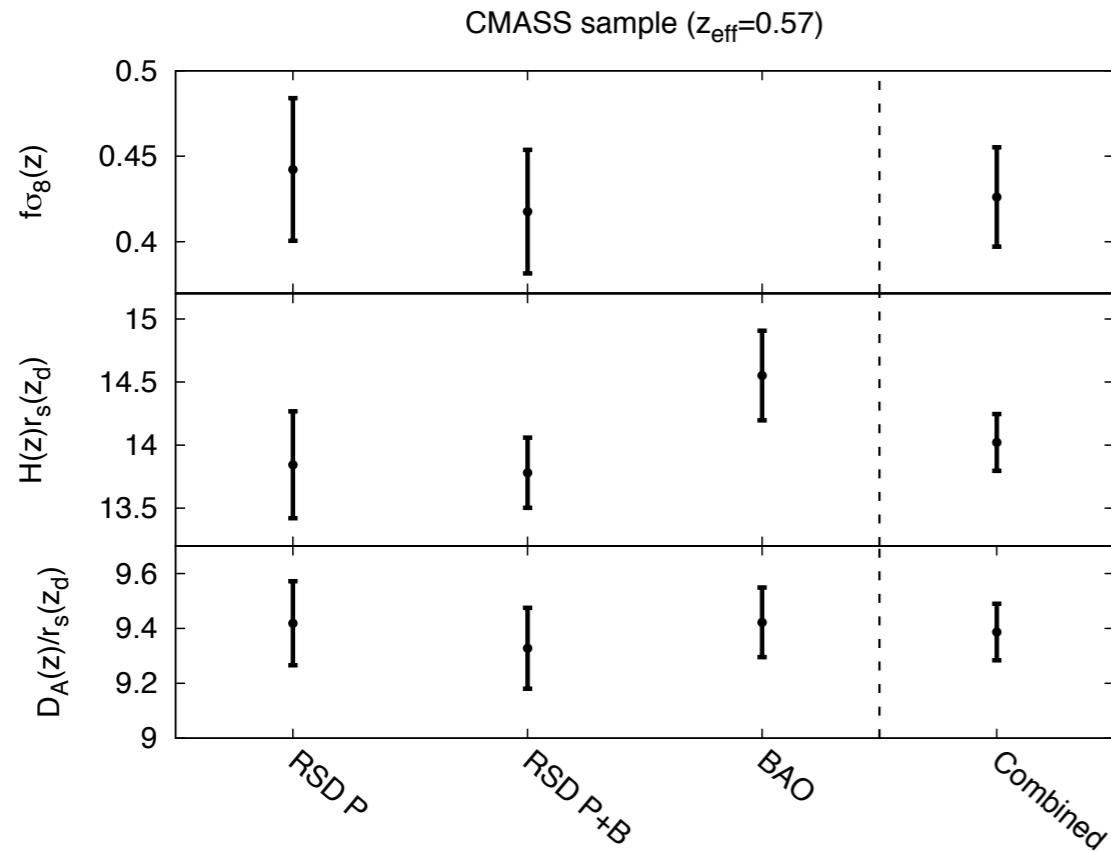
# Testing for Systematics

Name	$M_{\min}^h (N_p)$	$b_1$	$b_2$	$\bar{n} \times 10^4$
Low-bias $N$ -body	3.80 (50)	1.75	-0.26	6.75
Mid-bias $N$ -body	5.75 (75)	1.90	0.22	4.41
High-bias $N$ -body	8.36 (110)	2.07	0.49	2.90
MD-PATCHY (LOWZ)	-	2.08	0.43	4.0
MD-PATCHY (CMASS)	-	1.97	0.29	4.5
Data (LOWZ)	-	2.08	0.92	4.0
Data (CMASS)	-	2.01	0.68	4.5



- We run our cosmology data ‘pipeline’ on mocks & full  $N$ -body sims
- Determine our systematic budget &  $k$ -range of validity

# Results from BOSS



Sample	Analysis	$f\sigma_8(z_{\text{eff}})$	$H(z_{\text{eff}})r_s(z_d)$	$D_A(z_{\text{eff}})/r_s(z_d)$
LOWZ	<i>RSD P</i>	$0.394 \pm 0.064$	$11.41 \pm 0.56$	$6.35 \pm 0.19$
	<i>BAO</i>	—	$11.60 \pm 0.60$	$6.66 \pm 0.16$
	<i>RSD P+B</i>	$0.460 \pm 0.071$	$11.75 \pm 0.55$	$6.74 \pm 0.22$
	<i>Combined</i>	$0.427 \pm 0.056$	$11.55 \pm 0.38$	$6.60 \pm 0.13$
CMASS	<i>RSD P</i>	$0.444 \pm 0.042$	$13.92 \pm 0.44$	$9.42 \pm 0.15$
	<i>BAO</i>	—	$14.56 \pm 0.37$	$9.42 \pm 0.13$
	<i>RSD P+B</i>	$0.417 \pm 0.036$	$13.78 \pm 0.28$	$9.33 \pm 0.15$
	<i>Combined</i>	$0.426 \pm 0.029$	$14.02 \pm 0.22$	$9.39 \pm 0.10$

# Compression techniques for the Bispectrum

- Number of triangles (and information) grows as we reduce the binning.
- Bins highly correlated. How we deal with it? More mocks? Compression!
- For DESI / EUCLID information will need to be compressed in optimal way for maximising the outcome

$$0.03 \leq k[h / Mpc] \leq 0.12$$

**bin-size**      **#triangles**

$$\Delta k = 6k_f \longrightarrow 116$$

$$\Delta k = 5k_f \longrightarrow 195$$

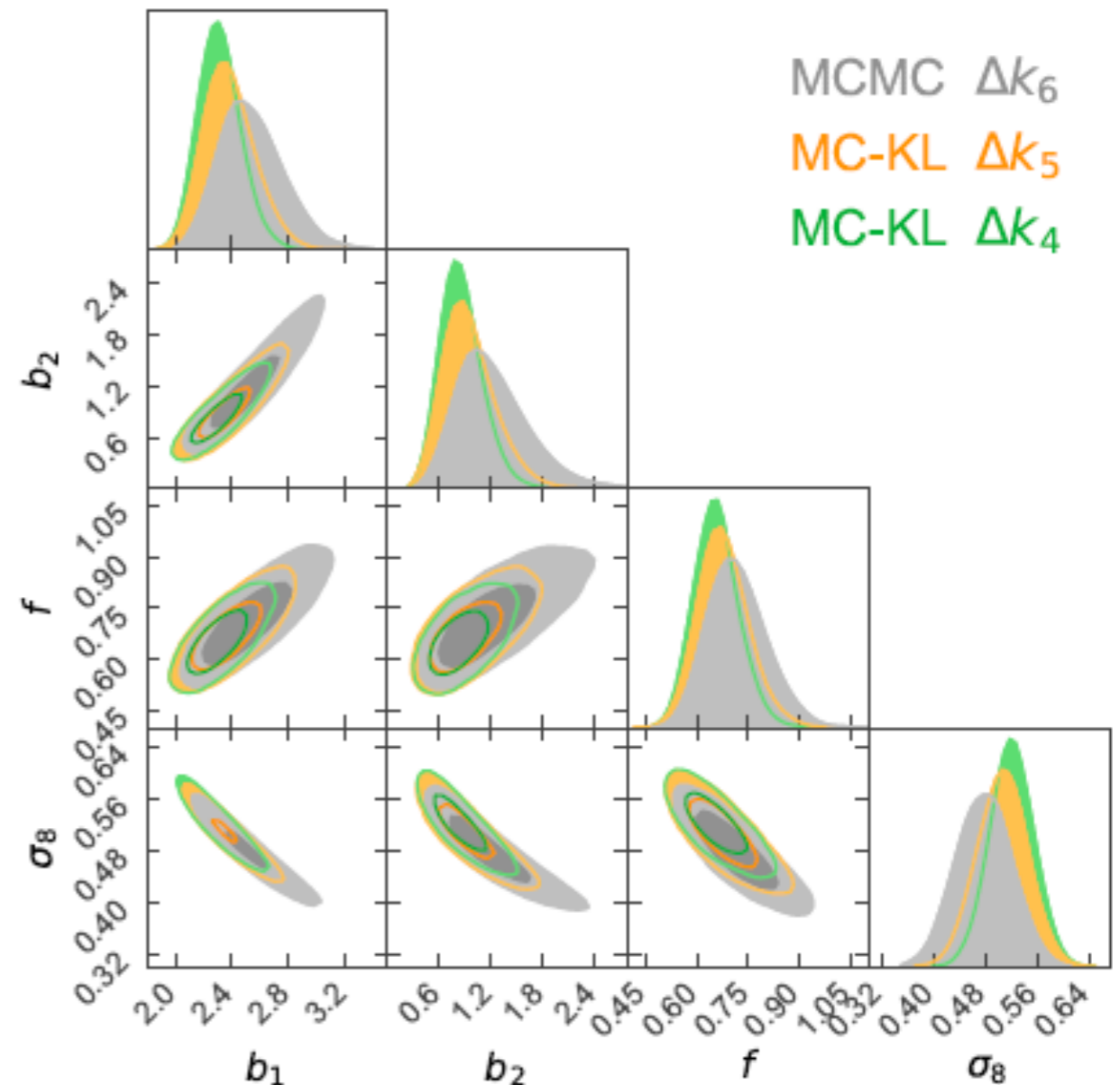
$$\Delta k = 4k_f \longrightarrow 404$$

$$\Delta k = 2k_f \longrightarrow 2734$$

**Gualdi et al. 2018** for details

**arxiv:1806.02853**

**Karhunen-Loeve algorithm+theoretical proposed cov.**



# Cosmology with BOSS, eBOSS & DESI

**BOSS**



2009-2014

**eBOSS**



2014-2019

**DESI**



2020-2024

## DESI in a nutshell

2.4M QSO  $1 < z < 2$

17M ELG  $1 < z < 2$

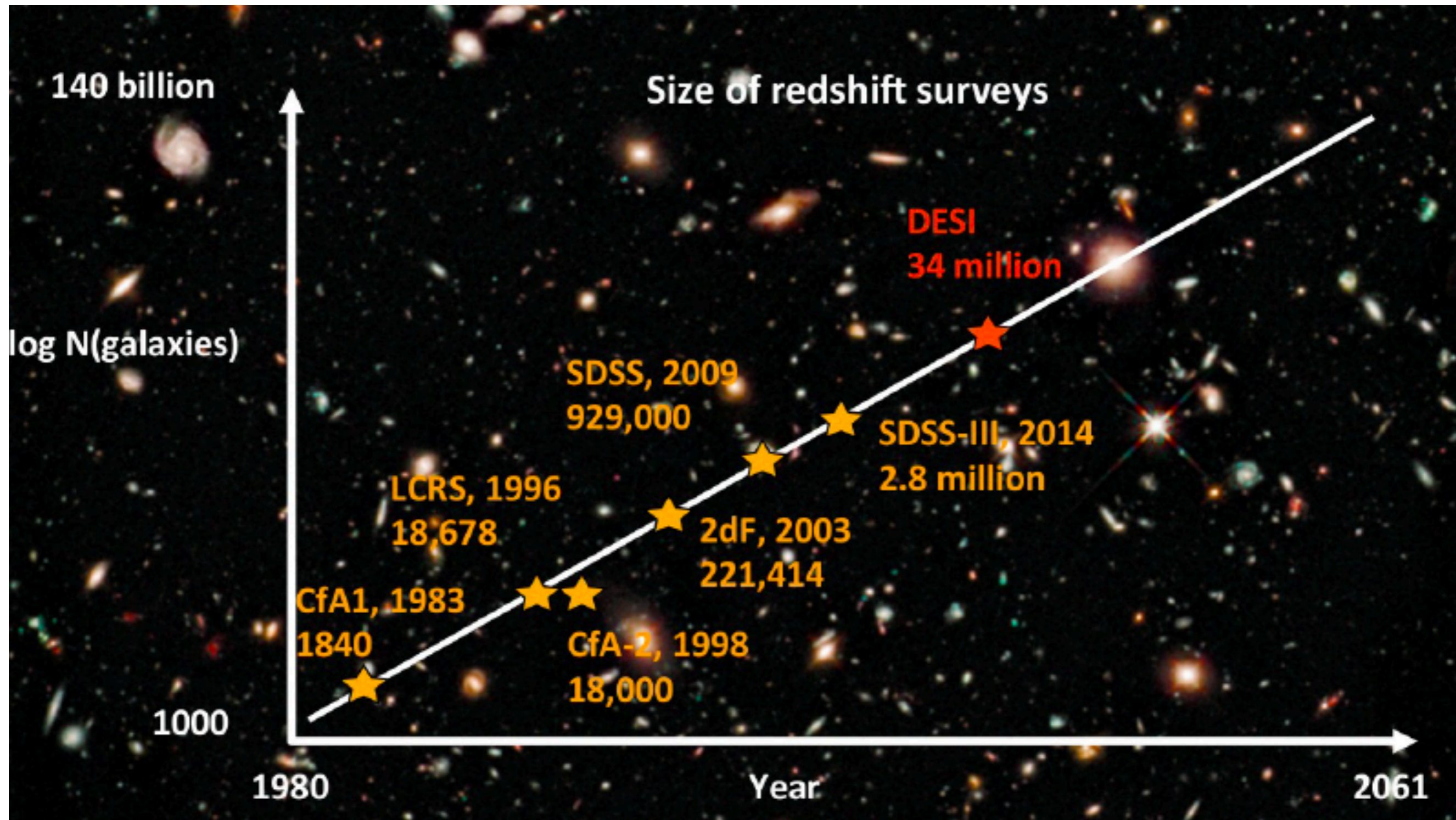
4M LRG  $0.2 < z < 1$

10M BG  $z < 0.2$

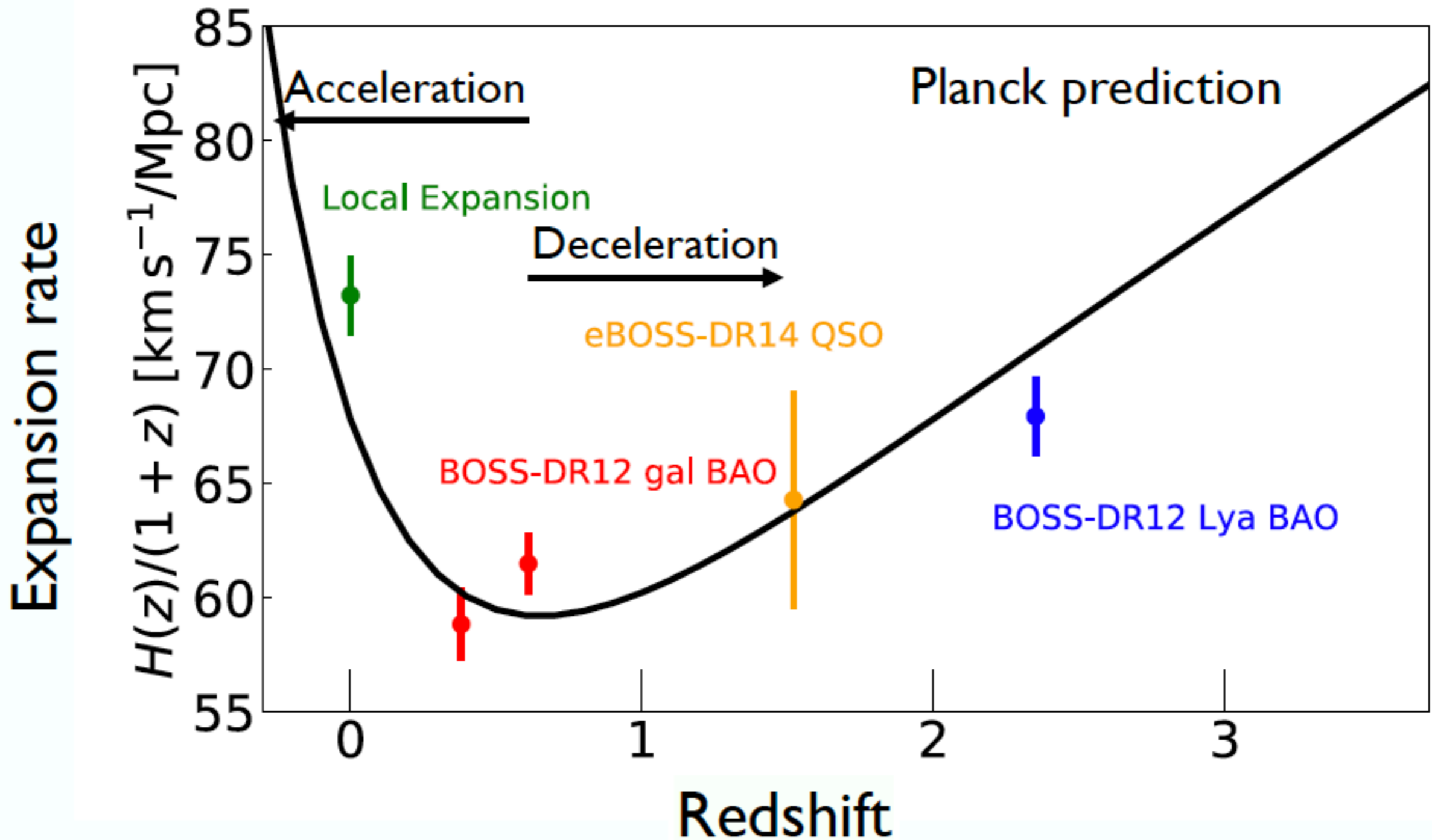
14,000 deg<sup>2</sup>

50 [Gpc/h]<sup>3</sup>

# Numbers of Spectroscopic Galaxy Surveys

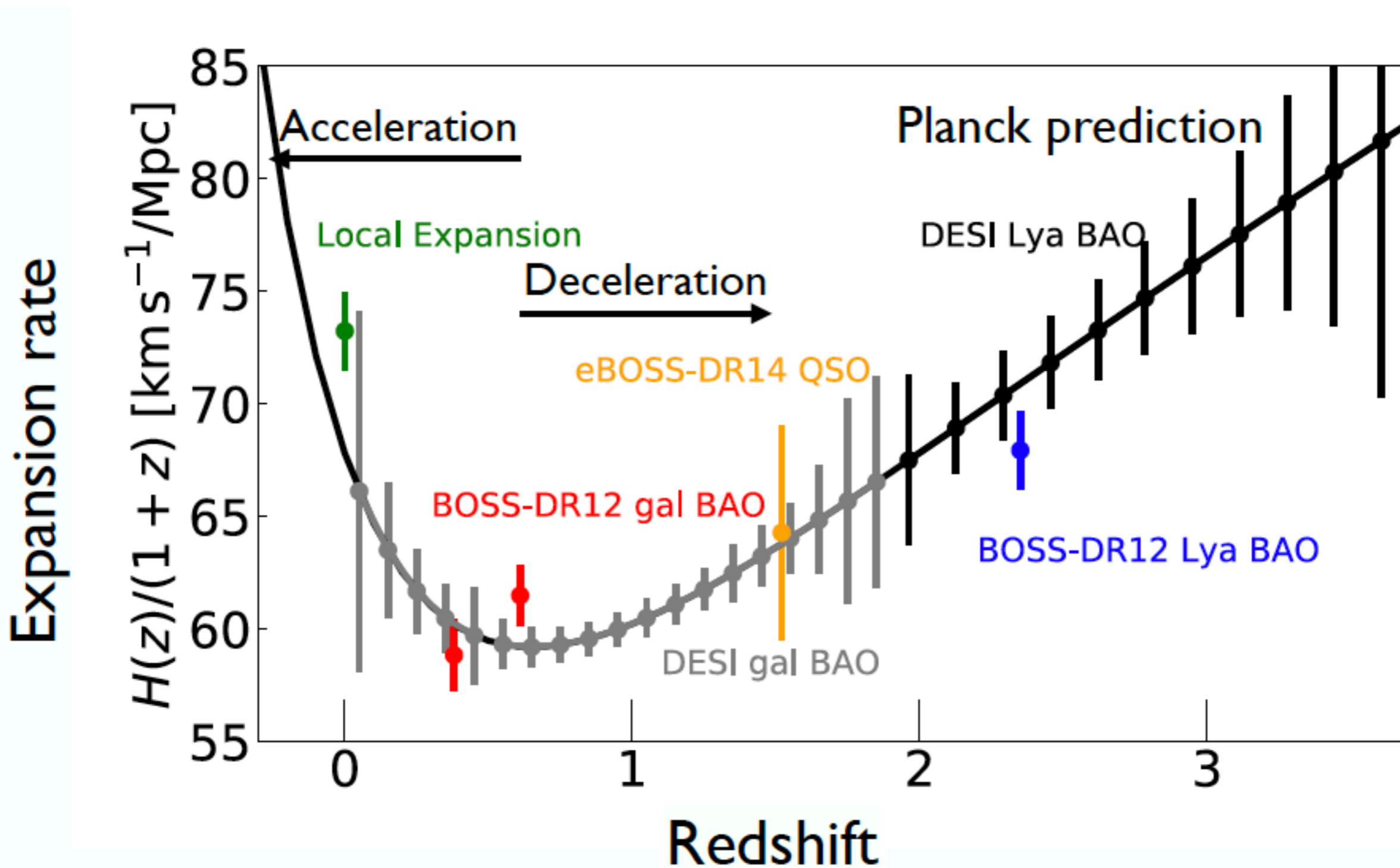


# Current state of the art $H(z)$ measurement

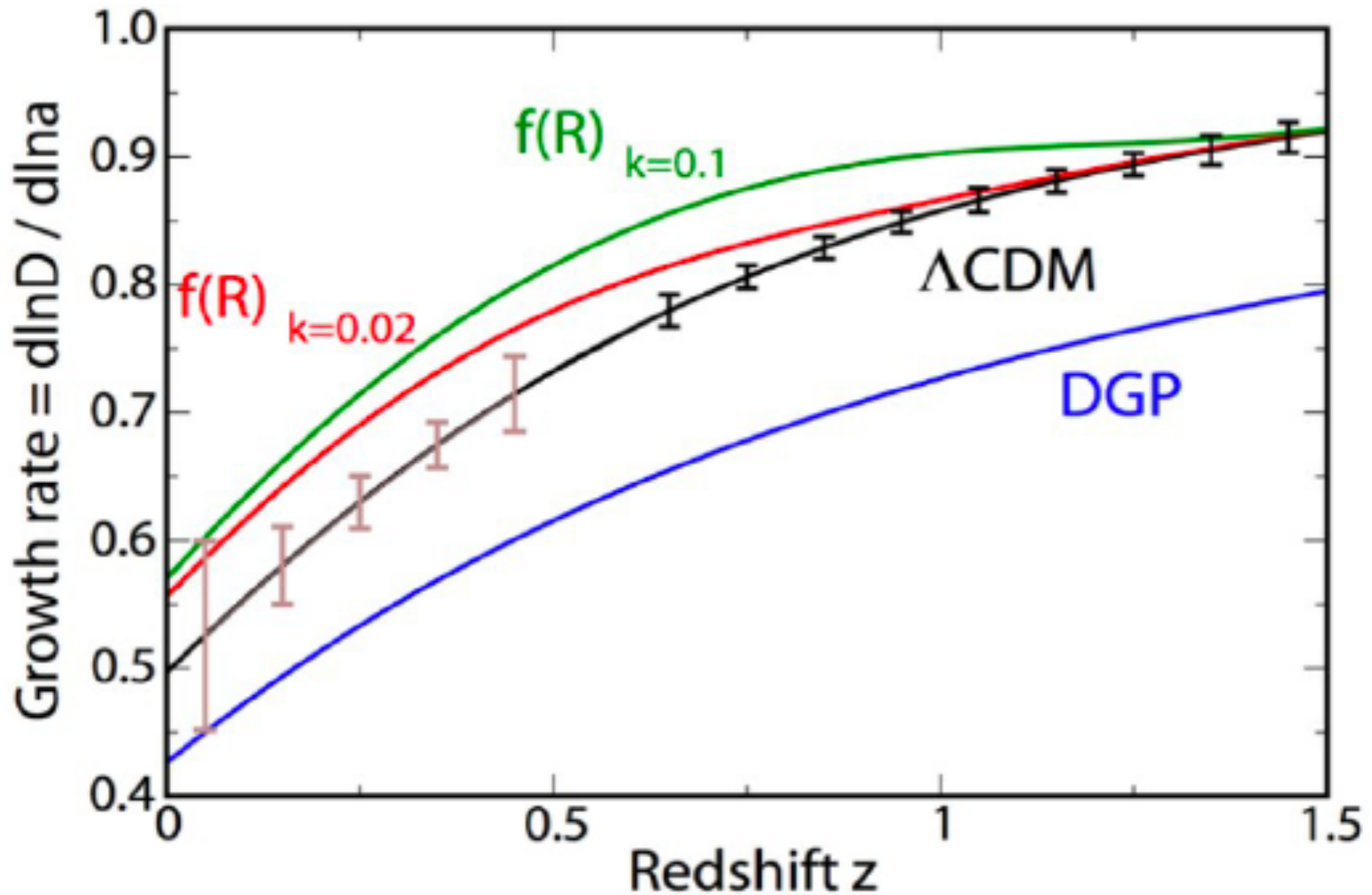




# DESI H(z) forecast



## DESI $f\sigma_8$ forecast



## Conclusions

- Using RSD in combination with AP effect allow us to measure  $H(z)$ ,  $D_A(z)$  and  $f\sigma_8(z)$  from 3D spectroscopic surveys
- BOSS and eBOSS have already demonstrated the power of BAO can be used to perform robust cosmological measurements
- Using 3PCF/Bispectrum allow us to shrink the statistical error-bars of cosmological parameters at a given volume (for free!)
- New approaches need to be developed to fully exploit the power of bispectrum on the next generation of spectroscopic surveys.