

Anisotropic Clustering Measurements using Fourier Space Wedges and the status of the BOSS DR12 analysis

Jan Niklas Grieb



Max-Planck-Institut für extraterrestrische Physik,
Garching bei München

Universitäts-Sternwarte München,
Ludwig-Maximilians-Universität München

TR33 Corfu Workshop
Thursday, September 20th, 2015

collaborators: A. Sánchez, F. Montesano, S. Salazar, R. Scoccimarro,
M. Crocce, C. Dalla Vechia, and the Galaxy Clustering working group

Outline

- 1 Introduction and Motivation
- 2 Anisotropic Clustering in Fourier Space
- 3 Covariance Matrices for Cubic and Cut-Sky Catalogues
- 4 Verification of the RSD Modelling
- 5 BOSS DR12 status
- 6 Conclusions

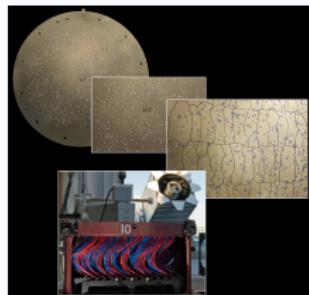


Introduction: BOSS, a large spec- z galaxy survey

Galaxy clustering with BOSS

- spectroscopic redshifts
- dense and robust targets:
 - luminous red galaxies (LOWZ) &
 - M_* - and volume limited (CMASS)

- $\bar{n} = 3 \cdot 10^{-4} \left(\frac{h}{\text{Mpc}} \right)^3$



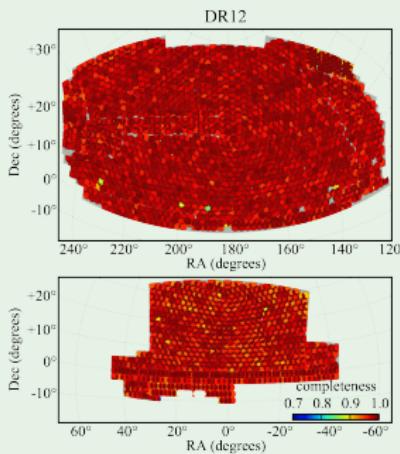
source: [lbl.gov]

- large volume:
7.4 Gpc³,
- $0.2 \leq z \leq 0.75$

- biased tracer of LSS
($b \sim 2$)

- rich analysis [Anderson et al. '14, Beutler et al. '14]

DR12 catalogue release



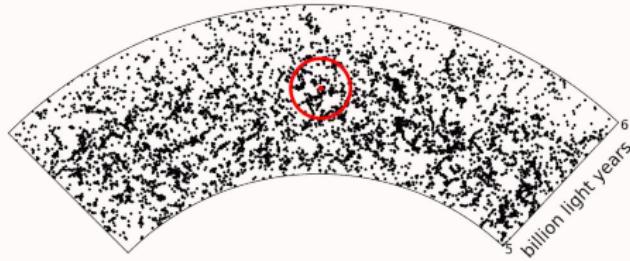
redshifts for 1,372,737 galaxies over 9,376 deg²

[Reid et al. '15 (in prep.)]

Motivation: anisotropic analysis of galaxy clustering

Aim for the BOSS Analysis

- Baryonic Acoustic Oscillations imprint in galaxy clustering signal

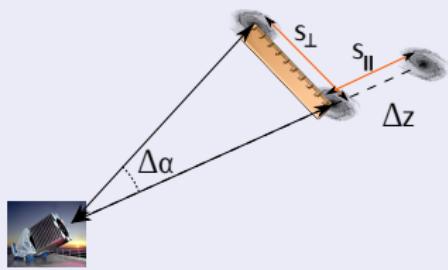


source: [F. Montesano]

- BAO serves as standard ruler
- probe of expansion history

Line-of-Sight Decomposition

- z -space matter clustering is inherently anisotropic



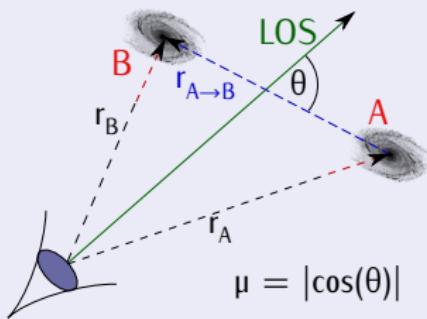
- constrain separately

$$D_A(z) = \frac{s_{\perp}}{\Delta\alpha(1+z)}$$

$$\text{and } H(z) = \frac{c\Delta z}{s_{\parallel}}$$

Extend clustering wedges to Fourier space

The LOS parameter μ

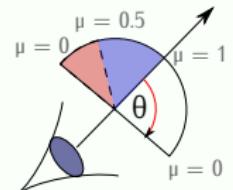


- analysis of config.-space wedges for BOSS DR11 [Sánchez et al. '13a, Sánchez et al. '13b]
- bad $\frac{S}{N}$ for fine μ -bins!

Power Spectrum Wedges

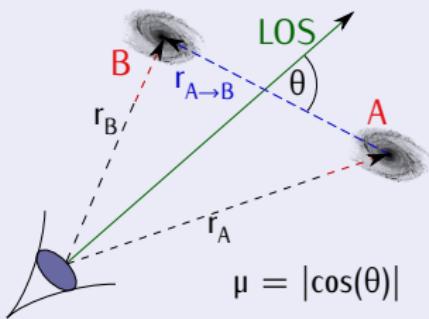
- $P(k, \mu) = \langle \delta(k, \mu) \delta^*(k, \mu) \rangle$
- averaged over wide bins in μ
- $P_{\mu_1, \mu_2}(k) \equiv \frac{1}{\mu_2 - \mu_1} \int_{\mu_1}^{\mu_2} P(\mu, k) d\mu$
- harmonized S/N
- simple window function description
- transverse projection
- $P_{\perp}(k) \equiv P_{0, \frac{1}{2}}(k)$
- line-of-sight projection
- $P_{\parallel}(k) \equiv P_{\frac{1}{2}, 1}(k)$

$$\mu = \cos(\theta)$$



Extend clustering wedges to Fourier space

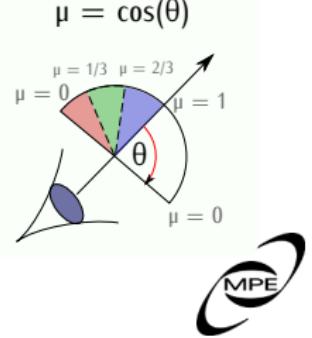
The LOS parameter μ



- analysis of config.-space wedges for BOSS DR11 [Sánchez et al. '13a, Sánchez et al. '13b]
- bad $\frac{S}{N}$ for fine μ -bins!

Power Spectrum Wedges

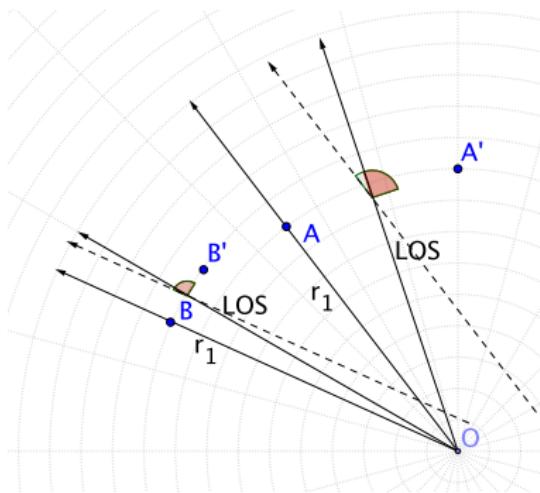
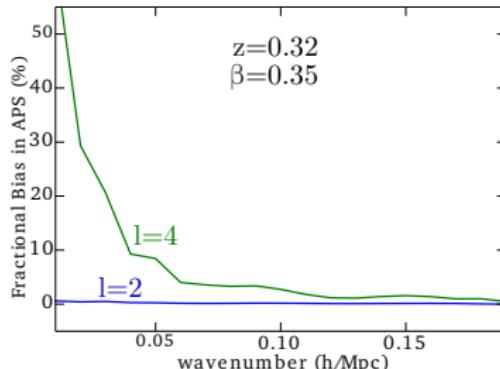
- $P(k, \mu) = \langle \delta(k, \mu) \delta^*(k, \mu) \rangle$
- averaged over wide bins in μ
- $P_{\mu_1, \mu_2}(k) \equiv \frac{1}{\mu_2 - \mu_1} \int_{\mu_1}^{\mu_2} P(\mu, k) d\mu$
- harmonized S/N
- simple window function description
- S/N even high enough for three wedges
- $P_{3w, i}(k) \equiv P_{\frac{i-1}{3}, \frac{i}{3}}(k)$



Measurements of Anisotropic Fourier-Space Clustering

Yamamoto-Blake estimator

- per-object-LOS approximation instead of pairwise LOS
- single direct sum (slow)
[Yamamoto et al. '06, Blake et al. '11]
- wide-angle bias for low- z and $\ell \geq 4$ [Samushia et al. '15]



[Samushia et al. '15]

Yamamoto-Blake estimator for Fourier space wedges

Yamamoto-Blake estimator for power spectrum multipoles

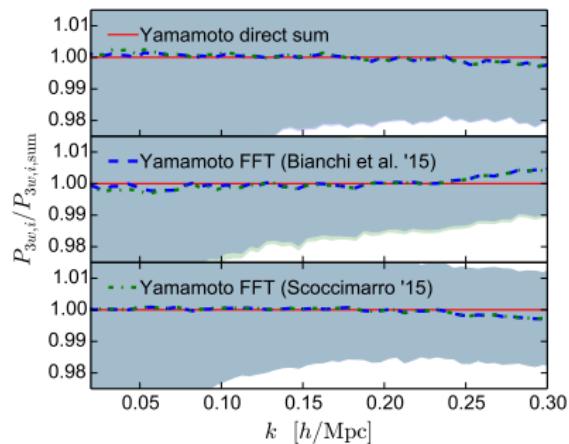
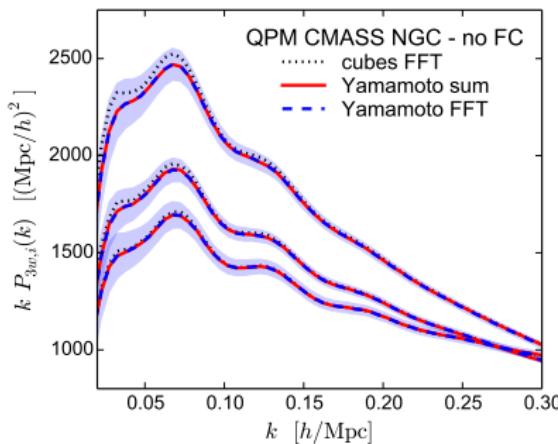
- covariance of density field with multipole field
- apply FKP weights to optimize variance [Feldman et al. '94]
- FFT-scheme for $P_\ell(\mu)$ developed [Bianchi et al. '15, Scoccimarro '15]
- much better scaling $N_{\text{fft}} \log N_{\text{fft}}$ instead of $N_k (N_{\text{gal}} + N_{\text{rnd}})$
- only works for a polynomial μ dependence
- transform $P_\ell(k)$ to wedges by

$$P_{\mu_1, \mu_2}(k) = \frac{1}{\mu_2 - \mu_1} \sum_{\ell \in \{0, 2, 4\}} P_\ell(k) \int_{\mu_1}^{\mu_2} \mathcal{L}_\ell(\mu) d\mu$$



FFT-based Clustering Wedges Estimation

- Test on 1000 QPM CMASS mocks (NGC, no fibre collisions)



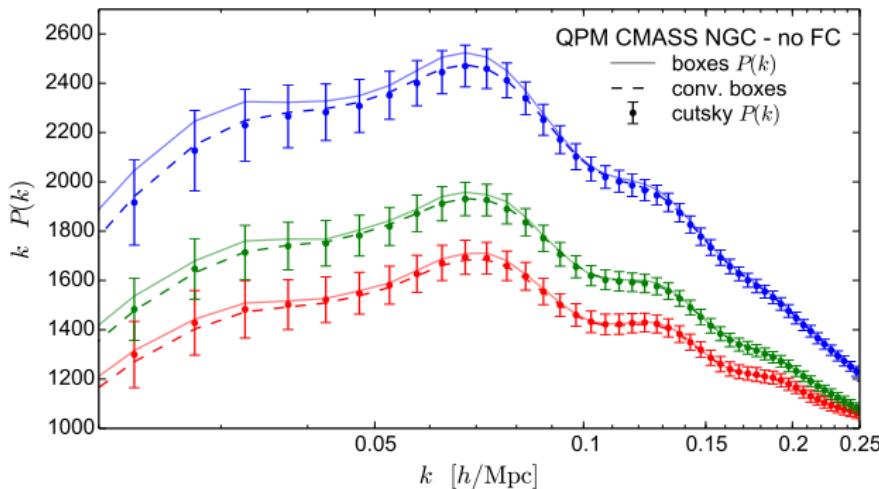
- similar results for covariance matrix

The Effect of the Window Function

- Convolution with **wedge window function** (assuming isotropy) – in analogy to monopole:

$$P_a^{\text{conv}}(k) = \int d^3 k' \left[P_a^{\text{model}}(k') W_a^2(|k \hat{e}_z - k'|) - \frac{W_a^2(k)}{W_0^2(0)} P_0^{\text{model}}(k') W_0^2(k') \right].$$

(second term: integral constraint)

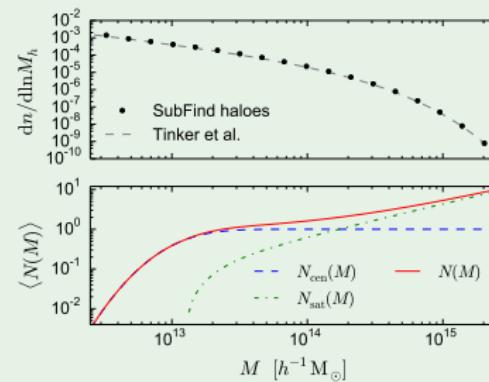


Covariance estimation for Clustering Wedges

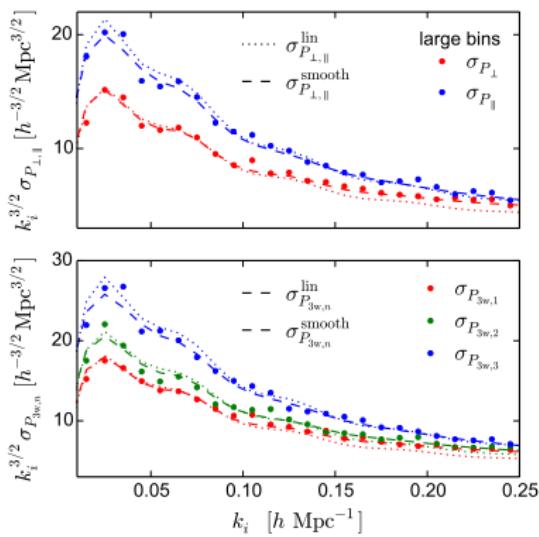
- Estimate for $P_a(k_i)$ -covariance $C_{ab}(k_i, k_j)$ either
 - theoretically derived (smooth, model required) or
 - measured from a large set of synthetic catalogues (noisy)

Full N-body MINERVA simulations

- Verification of covariance estimate (and RSD modelling)
- 100 realizations,
 $V = 3.37 \text{ (Gpc}/h)^3$
- HOD galaxies at $z = 0.57$
 mimicking CMASS sample
 (similar \bar{n} and clustering)



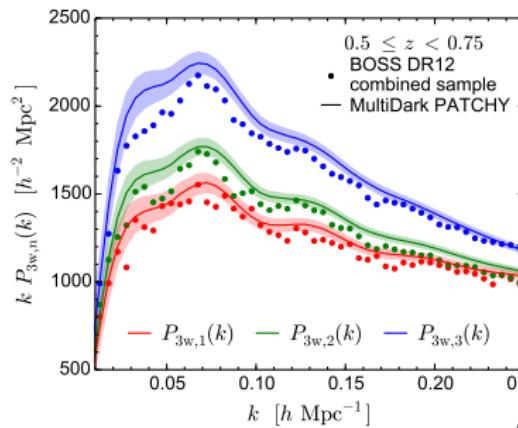
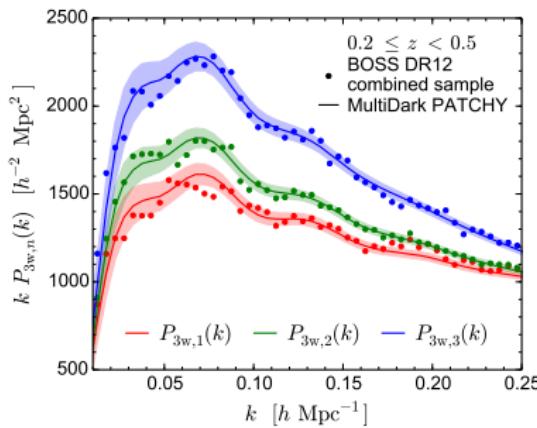
The Covariance Matrix for Fourier-Space Wedges



- Need of a **smooth and accurate** covariance estimate for **verification** of RSD modelling
- For a regular **cubic simulation**, Fourier modes $P(k, \mu)$ are **uncorrelated** on large scales
- **Variance** can be constructed by a **Gaussian model** using an RSD power spectrum
- published together with configuration-space covariance
[JG et al. '15a (submitted)]

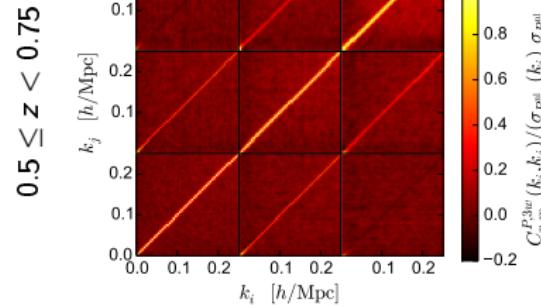
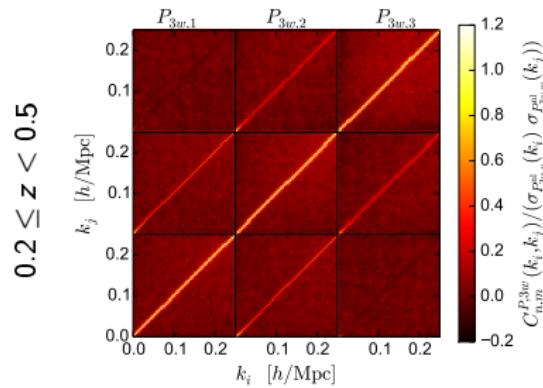
Synthetic Catalogues as Covariance Estimate

- noise in covariance propagates to the final constraints [Percival et al. '14]
- accurate constraints require $\mathcal{O}(10^3)$ of synthetic catalogs (*mocks*)
- quick generation: non-linear evolution w/ fast approximative schemes
- mimicking full survey including veto regions and fibre collisions



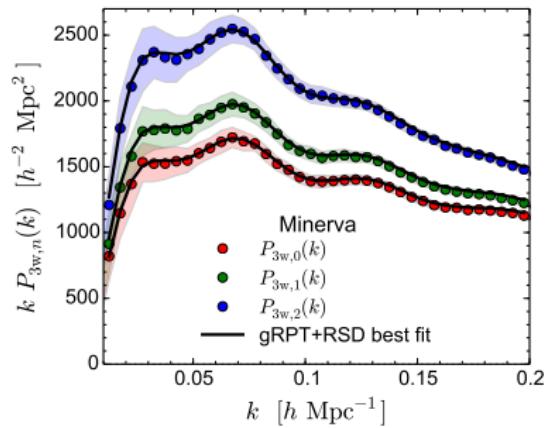
The Covariance Matrix for Fourier-Space Wedges

- the **survey geometry** introduces **correlations** on the off-diagonals
- fibre collisions** also correlate distant bins
- two sets of mocks: **MULTIDARK-PATCHY** and QPM



Modelling the Power Spectrum in the trans-linear regime

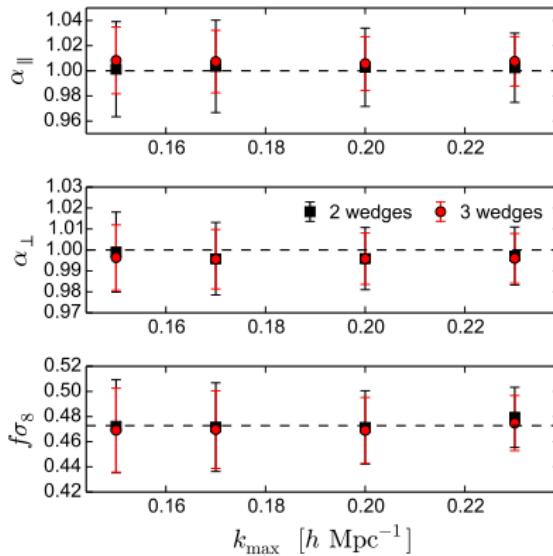
- new approach for **renormalized perturbation theory (gRPT)**
[Scoccimarro, Crocce et al. '15 (in prep.)]
- linear, non-linear and non-local **galaxy bias** ($b_1, b_2, \gamma_2, \gamma_3, \sigma_8$)
- **RSD** using a new concept for the fingers-of-God (a)
- fit of BAO-AP ($\alpha_{\parallel}, \alpha_{\perp}$), and RSD (f , growth of structure)
- **same model** used in, both, configuration and Fourier space



Verification of the modelling

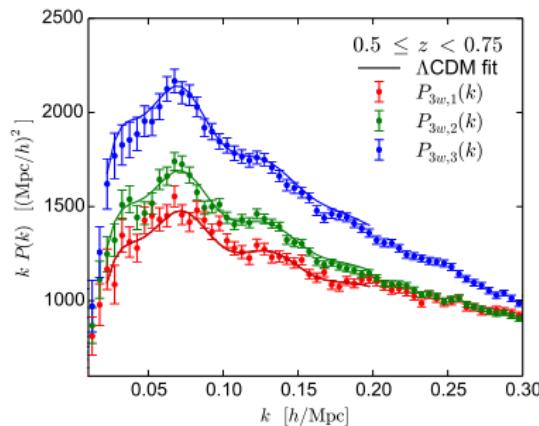
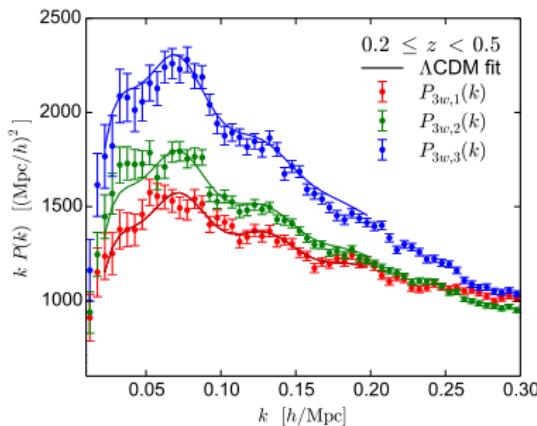
Validation of the RSD modelling

- Verify the modelling of PS wedges with MINERVA simulations
- Smallest possible modes – k_{\max} – to get unbiased parameters?



- unbiased $\alpha_{\parallel}, \alpha_{\perp}$ & $f\sigma_8$ sets
limit $k_{\max} = 0.2 h/\text{Mpc}$
- varying the shot noise
(prepare for cut-sky fits)
introduces small $\alpha_{\perp,\parallel}$ bias
- tighter constraints for 3 wedges

Ready to fit the DR12 galaxy catalog



PS fits not ready for the public yet, but...

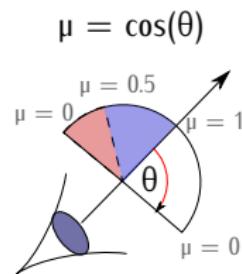
- model predictions using Ariel's preliminary 2PCF fits
- good agreement between Fourier and configuration space
- be patient until the release!



Conclusions

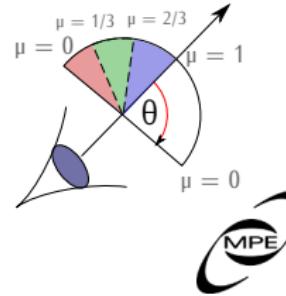
i) new RSD model for galaxy clustering

- Major improvement, state-of-the art modelling for analysis both in configuration and Fourier space
- Tested and validated with large-scale simulations



ii) BOSS Power Spectrum Wedges

- largest volume probed so far for galaxy clustering analysis, optimized data processing and fitting
- intensive work on final analysis
- highest demands: complementary analysis for multipoles and wedges in conf. and Fourier space



References I

-  <http://newscenter.lbl.gov/2012/08/08/boss-sdss-dr9/>
-  L. Anderson, É. Aubourg, S. Bailey, F. Beutler, et al. (BOSS Collaboration), *Mon.Not.Roy.Astron.Soc.* **441**, 24 (2013), arXiv:1312.4877
-  R. Angulo, C. Baugh, C. Frenk, and C. Lacey, *Mon.Not.Roy.Astron.Soc.*, **383**, 755 (2008), arXiv:astro-ph/0702543
-  F. Beutler, S. Saito, H.-J. Seo, J. Brinkmann, K. Dawson, D. J. Eisenstein, et al. (BOSS Collaboration) *Mon.Not.Roy.Astron.Soc.*, **443**, 1065 (2014), arXiv:1312.4611
-  D. Bianchi, H. Gil-Marín, R. Ruggeri, W. J. Percival, (2015), arXiv:1505.05341
-  C. Blake, S. Brough, M. Colless, C. Contreras, W. Couch, et al. , *Mon.Not.Roy.Astron.Soc.*, **415**, 2876 (2011), arXiv:1104.2948 [astro-ph.CO]
-  H. A. Feldman, N. Kaiser, J. A. Peacock, *Astrophys.J.*, **426**, 23 (1994), arXiv:astro-ph/9304022
-  J. N. Grieb, A. G. Sánchez, S. Salazar-Albornoz, C. dalla Vecchia, (2015, submitted to MNRAS), arXiv:1509.04293 [astro-ph.CO]
-  J. N. Grieb, A. G. Sánchez, F. Montesano, S. Salazar-Albornoz, R. Scoccimarro, M. Crocce et al. , (2015, in prep.)
-  J. Hartlap, P. Simon, and P. Schneider *Astron.Astrophys.* (2006), arXiv:astro-ph/0608064
-  Komatsu, E. et al. *ApJS*, **192**, 18 (2011), arXiv:1001.4538 [astro-ph.CO]

References II

-  [W. J. Percival, A. J. Ross, A. G. Sánchez, L. Samushia, A. Burden, et al. \(BOSS Collaboration\),
Mon.Not.Roy.Astron.Soc. **439**, 2531 \(2014\)](#)
-  [L. Samushia, E. Branchini, and W. Percival,
\(2015\), arXiv:1504.02135](#)
-  [A. G. Sánchez, E. A. Kazin, F. Beutler, et al. \(BOSS Collaboration\)
Mon.Not.Roy.Astron.Soc. **433** 1202 \(2013\), arXiv:1303.4396](#)
-  [A. G. Sánchez, F. Montesano, E. A. Kazin, et al. \(BOSS Collaboration\)
Mon.Not.Roy.Astron.Soc. **440** 692 \(2013\), arXiv:1312.4854](#)
-  [R. Scoccimarro,
\(2015\), arXiv:1506.02729](#)
-  [K. Yamamoto, M. Nakamichi, A. Kamino, B. A. Bassett, H. Nishioka,
Publ.Astron.Soc.Jap., **58**, 93 \(2006\), arXiv:astro-ph/0505115](#)

Angular Diameter Distance and the BAO

- Angular Diameter Distance,

$$D_A(z) = c \int_0^z \frac{dz'}{H(z')}$$

- Sound Horizon,

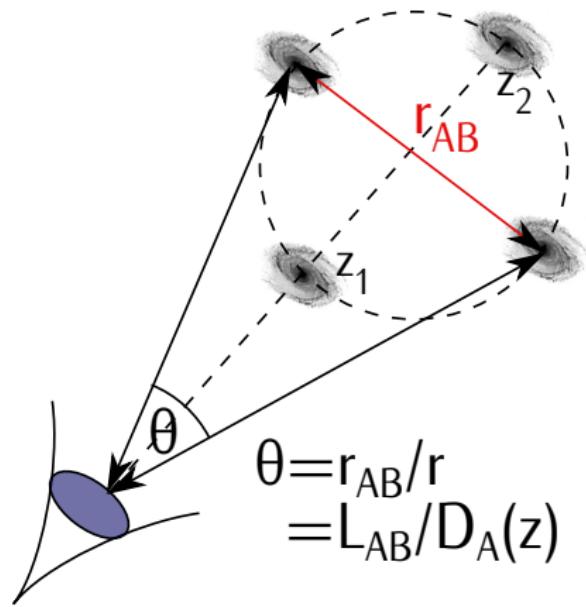
$$r_s = \int_0^{t_{\text{dec}}} \frac{c_s(t') dt'}{a(t')},$$

known from CMB measurements
 $(r_s = 147 \text{ Mpc} [\text{Komatsu et al. '11}])$

- From the BAO position,
 we can get ($r_{\text{BAO}} = r_s$)

$$\theta_{\text{BAO}} = \frac{1}{1+z} \frac{r_s}{D_A(z)}$$

$$\Delta z_{\text{BAO}} = \frac{r_s H(z)}{c}$$



$$\begin{aligned}\theta &= r_{\text{AB}}/r \\ &= L_{\text{AB}}/D_A(z)\end{aligned}$$

Dependence of Geometry on Cosmology

- Fiducial cosmology of simulations: $w = w_{\text{true}} = -1$
- Assumed cosmology from measurement: $w_{\text{assumed}} = w_{\text{true}} + \Delta w$
- Mismatch causes **geometry of the late universe to be misinterpreted**
- Relates to change $\alpha = k_{\text{app}}/k_{\text{true}}$ [Angulo et al. '08]

$$\alpha_{\perp} = \frac{D_A(z, w_{\text{assumed}})}{D_A(z, w_{\text{true}})}, \quad \alpha_{\parallel} = \frac{H(z, w_{\text{true}})}{H(z, w_{\text{assumed}})}$$
$$\alpha \approx \alpha_{\perp}^{-2/3} \alpha_{\parallel}^{1/3}$$

D_A angular diameter distance, H Hubble parameter D_A and the BAO

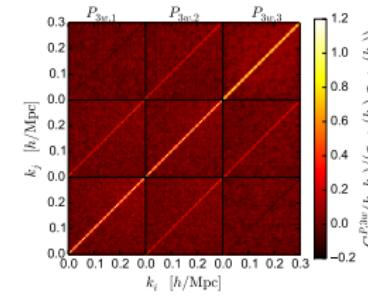
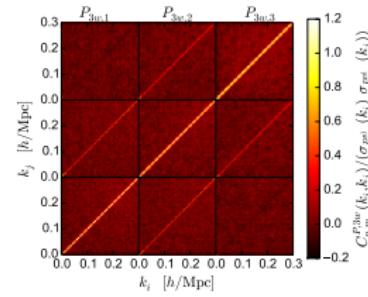
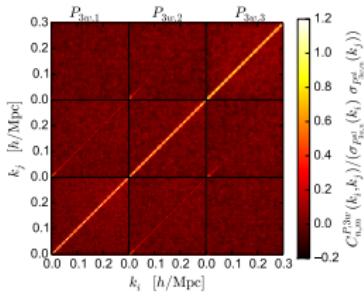
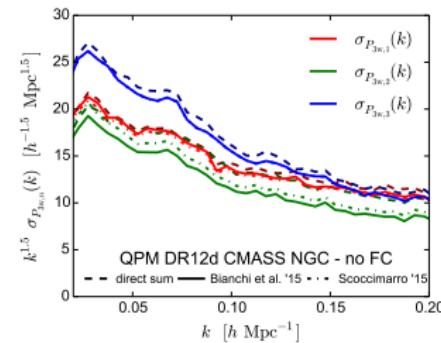
- **Goals:** $\langle \alpha \rangle = 1$ (no bias), $\langle |\Delta \alpha| \rangle \ll 1$ (high precision)
- $\Delta \alpha$ and Δw of same magnitude

◀ go back



FFT-based Clustering Wedges Estimation – Covariance

- Correlation matrix for 1000 QPM CMASS mocks (NGC, no fibre collision)



Estimation of Model Parameters using MCMC

- Likelihood function for *mean* power spectrum wedges $\bar{P}_{\parallel,\perp}(k)$, measured at wavenumber bins k_i :

$$\mathcal{P}(\bar{P}|\theta) \propto \exp[-\chi^2(\bar{P}|\theta)/2], \quad \text{where}$$

$$\chi^2(\bar{P}|\theta) = \sum_{x,y,i,j} \left[\bar{P}_x(k_i) - P_{x,\text{rpt}}(k_i) \right] C_{xyij}^{-1} \left[\bar{P}_y(k_j) - P_{y,\text{rpt}}(k_j) \right]$$

- covariance matrix estimated from set of realizations

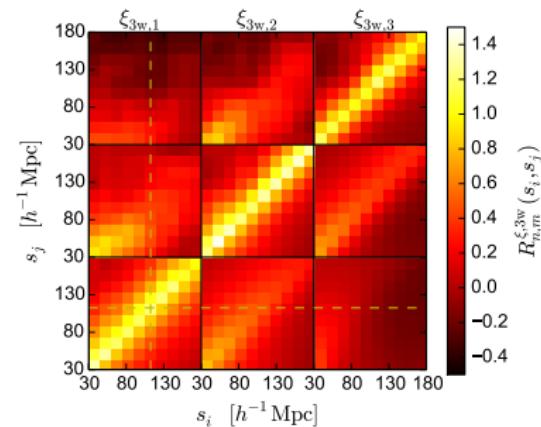
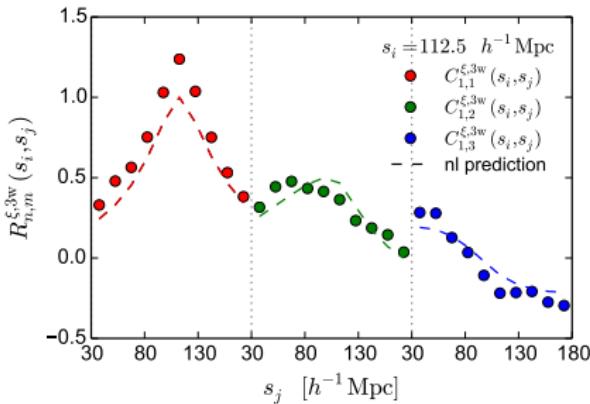
$$C_{xyij} = \langle \left[P_x(k_i) - \bar{P}_x(k_i) \right] \left[P_y(k_j) - \bar{P}_y(k_j) \right] \rangle$$

- inverse corrected for noise [Hartlap et al. '06]
- step through parameter space using **Markov chain Monte Carlo**

[◀ go back](#)



Excursion to Configuration-Space Wedges



- significant correlation because of Fourier transform
- 2PCF variance can be constructed from $\sigma_P^2(k, \mu)$ easily by integration
[JG et al. '15a (submitted)]

upper diag: data / lower diag: theory

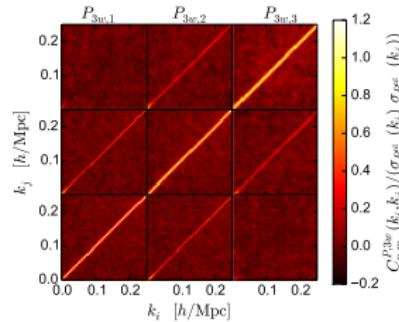
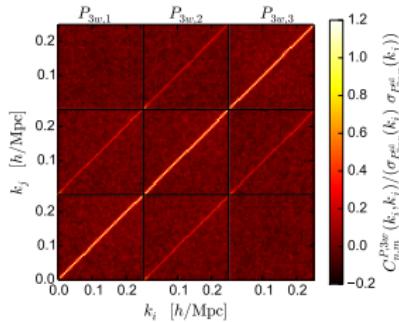
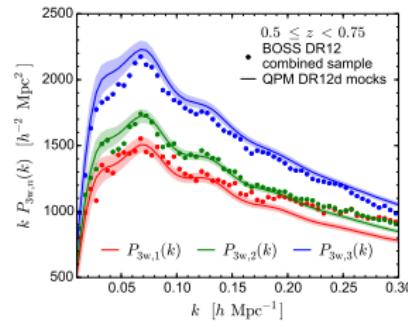
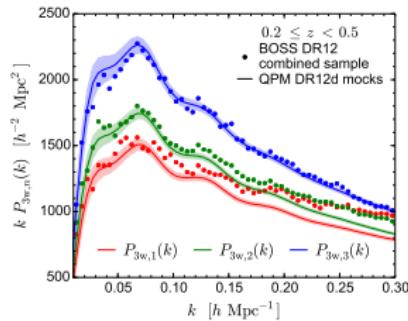
Measurement Noise Level

- high level of noise because #bins \simeq #simulations



QPM Mocks: PS wedges and their covariance

- low-resolution particle mesh + HOD post-processing, 1000 mocks



◀ PATCHY PS wedges

◀ PATCHY covariance matrix

BOSS Mock Challenge

- Model performance compared in a **blind challenge**
- Blind results handed in and **analyzed**

New Results for Cutsky Mocks

- Too optimistic choice of k_{\max}
- Need to vary the shot noise

