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

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Outline



- 2 Anisotropic Clustering in Fourier Space
- Ovariance Matrices for Cubes and Cut-Sky Catalogs
- 4 Verification of the new RSD Model
- 5 BOSS DR12 status





Motivation: Anisotropic Analysis of Galaxy Clustering

Aim for the BOSS Analysis

- Excellent large spectroscopic galaxy sample
- Baryonic Acoustic Oscillations imprint in galaxy clustering signal



source: [F. Montesano]

- BAO serves as standard ruler
- probe of expansion history

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Fourier Space Wedges

Line-of-Sight Decomposition

• *z*-space matter clustering is inherently anisotropic



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

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

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Extend Clustering Wedges to Fourier Space



$$P(k,\mu) = \langle \delta(k,\mu)\delta^*(k,\mu) \rangle$$

• bad $\frac{S}{N}$ for fine μ -bins!

Power Spectrum Wedges

- $P(\mu, k)$ averaged over wide bins in μ
- harmonized S/N

•
$$P_{\mu_1,\mu_2}(k) \equiv \frac{1}{\mu_2 - \mu_1} \int_{\mu_1}^{\mu_2} P(\mu, k) \, \mathrm{d}\mu$$

- simple window function description $\mu = \cos(\theta)$
- transverse projection $P_{\perp}(k) \equiv P_{0,\frac{1}{2}}(k)$
- line-of-sight projection $P_{\parallel}(k) \equiv P_{\frac{1}{2},1}(k)$





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- simple window function description $\mu = \cos(\theta)$
- 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 Clustering

Yamamoto estimator

- pairwise LOS depends on observer and galaxy pair
- double sum over objects [Yamamoto et al. '05]
- *impossible* scaling $N_k (N_{gal}^2 + N_{rnd}^2)!$



[Samushia et al. '15]



Measurements of Anisotropic Clustering

Yamamoto-Blake estimator

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





Yamamoto estimator for Fourier space wedges I

Yamamoto Estimator for Clustering Wedges

- extend Yamamoto estimator to any number of wedges
- replace Legendre polynomials by μ -top-hat functions
- wedge (or multipole) overdensity field

$$F_{a} = \frac{1}{\sqrt{A}} \left[D_{a}(k) - \alpha R_{a}(k) \right]$$

weighted sum over galaxies and randoms $(1/\alpha \text{ more numerous})$:

$$D_{a}(k) = \sum_{i} w_{i} e^{i\mathbf{k}\cdot\mathbf{x}_{i}} \Theta_{a}(\mu_{ki}),$$

$$R_{a}(k) = \sum_{j} w_{j} e^{i\mathbf{k}\cdot\mathbf{x}_{j}} \Theta_{a}(\mu_{kj})$$

 $\theta_a(\mu)$: top-hat for this wedge, with argument $\mu_{ki} := \frac{k \cdot x_i}{|k||x_i|}$. • spoils use of FFTs!?

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Conclusions

Yamamoto estimator for Fourier space wedges II

• wedge power spectrum computed as:

$$P_a(k) = F_a(k)F_0(k)^* - \frac{S_a}{A}$$

- normalization $A := \alpha \sum_{j} \bar{n}_{j} w_{j}^{2}$ (just as for FKP), \bar{n}_{j} : the estimated number density of galaxies.
- shot noise $S_a(k) = \alpha(\alpha + 1) \sum_j w_j^2 \Theta_a(\mu_{kj})$

for polynomial μ dependence:

• fast FFT-scheme for $P_{\ell}(\mu)$ developed [Bianchi et al. '15, Scoccimarro '15]

•
$$\mu^2 = \sum_{ij} \frac{x_i x_j}{x^2} \frac{k_i k_j}{k^2} \longrightarrow 6$$
 combinations

• *unbeatable* scaling 6 $N_{\rm fft}$ log $N_{\rm fft}$ instead of $N_k (N_{\rm gal} + N_{\rm rnd})$



FFT-based Clustering Wedges Estimation



- $P_{\ell}(k)$ by Yamamoto-FFT estimator (EUCLID comparison project)
- transform to wedges by

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



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Fourier Space Wedges

A First Look at the Data: BOSS DR12 sample





The Effect of the Window Function

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

$$P_{a}^{\text{conv}}(k) = \int d^{3}\boldsymbol{k}' \left[P_{a}^{\text{model}}(k') W_{a}^{2}(|k\hat{\boldsymbol{e}}_{z} - \boldsymbol{k}'|) - \frac{W_{a}^{2}(k)}{W_{0}^{2}(0)} P_{0}^{\text{model}}(k') W_{0}^{2}(k') \right].$$

(second term: integral constraint)



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Covariance estimation for Clustering Wedges

- Estimate $P_a(k_i)$ -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 n
 and clustering)



The Covariance Matrix for Fourier-Space Wedges



- For a cubic box, Fourier modes
 P(k, μ) are uncorrelated on large scales
- Variance can be constructed by a Gaussian model using an RSD power spectrum [JG et al. '15a (in prep.)]

• volume-average for each power spectrum bin $\int_{k_1}^{k_2} d^3k \dots$



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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





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60000 50000 0.2 < z < 0.5

40000

30000

20000

1000

60000

50000

40000

30000

20000

S/N² (0.02 h/Mpc;

3 wedges

2 wedges

< 0.75

3 wedges

2 wedges

0.05

0.15

The Covariance Matrix for Fourier-Space Wedges

- the survey geometry introduces correlations on the off-diagonals
- fibre collisions also correlate distant bins



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Fourier Space Wedges

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Verification of the modelling

Validation of the new RSD model (to Ariel's talk)

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



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



New Results for Cutsky Mocks

BOSS Mock Challenge

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

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



Introduction and Motivation Anisotropic Clustering Covariance Estimation Model Verification BOSS DR12 status Conclusions

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

 $\mu = \cos(\theta)$





Outlook! Questions?

Outlook

- Analysis is tremendous team effort
- Onsistency check: configuration and Fourier space
- **O** Unprecedented accuracy can be expected
 - Thank you for your attention!

• Time for all your questions!



References

NOT UP TO DATE!

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Angular Diameter Distance and the BAO

• Angular Diameter Distance,

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

• Sound Horizon,

$$r_s = \int_0^{t_{
m dec}} rac{c_s(t')\,{
m d}t'}{a(t')}$$
 ,
known from CMB measurements

 $(r_s = 147 \; \mathrm{Mpc} \; [\mathrm{Komatsu \; et \; al. \; '11}])$

• From the BAO position, we can get $(r_{AB} = r_s)$ $\theta_{BAO} = \frac{1}{1+z} \frac{r_s}{D_A(z)}$ $\Delta z_{BAO} = \frac{r_s H(z)}{c}$





References

Dependence of Geometry on Cosmology

- Fiducial cosmology of simulations: $w = w_{\text{true}} = -1$
- Assumed cosmology from measurement: $w_{assumed} = w_{true} + \Delta w$
- Mismatch causes geometry of the late universe to be misinterpreted
- Relates to change $\alpha = k_{app}/k_{true}$ [Angulo et al. '08] $\alpha_{\perp} = \frac{D_A(z, w_{assumed})}{D_A(z, w_{true})}, \quad \alpha_{\parallel} = \frac{H(z, w_{true})}{H(z, w_{assumed})}$ $\alpha \approx \alpha_{\perp}^{-2/3} \alpha_{\parallel}^{1/3}$

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

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



References

Estimation of Model Parameters using MCMC

• Likelihood function for *mean* power spectrum wedges $\bar{P}_{\parallel,\perp}(k)$, measured at wavenumber bins k_i : $\mathcal{P}(\bar{P}|A) \sim \exp[-\chi^2(\bar{P}|A)/2]$ where

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

• 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

