Precision cosmology with galaxy surveys: σ_8 tension?

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Based on collaboration with

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CMB (~2D) vs. Galaxy Surveys (3D)



Tegmark & Zaldarriaga 09

Need a stringent test of LCDM model



σ_8 tension? – a hint of new physics?



The SDSS spectroscopic survey: BOSS (completed)



- This talk is based on the final BOSS data: ~1M early-type luminous galaxies ("LOWZ" and "CMASS" samples) over 0.2<z<0.75 and the solid angle of 10,000 sq. deg.
 - These galaxies are selected based on the specifically-tuned color and flux cuts
- Redshift-space power spectrum of galaxies a very powerful method of testing cosmological models

$$P_{\rm gg}^S(k,\mu) = |\delta_{\rm g}^S(\mathbf{k})^2|$$

Power of spec-z galaxy survey: BAO geometrical test



Radius (Mpc)

• Free from galaxy bias uncertainty

Power of spec-z galaxy survey: BAO geometrical test (cont'd)

- Paired galaxies have preferred separation (rs) standard ruler, i.e. baryon acoustic oscillation (BAO)
- The "observed" angular separation and redshift difference of BAO galaxy pairs give measurements of the angular diameter distance and the Hubble expansion rate (at the galaxy redshift)



Power of spec-z galaxy survey: redshift-space distortion (RSD)

• Galaxies have peculiar motions according to the gravitational field of large-scale structure $ds^{2} = -(1 + 2\Psi(t, \mathbf{x}))dt^{2} + a^{2}(1 + 2\Phi(t, \mathbf{x}))d\mathbf{x}^{2}$

 $\frac{1}{a}\frac{d(au_g)}{dt} = \frac{1}{a}\nabla\Psi$ Different types of galaxies would follow the same peculiar velocity field due to equivalence principle (the gravity field is by dark matter)

 The observed redshift of each galaxy is distorted by the peculiar velocity (RSD). This RSD effect causes anisotropic clustering pattern in the observed distribution of galaxies (Kaiser 87)

$$\Delta z = u_{\rm g\parallel} \to \Delta x_{\parallel} = \frac{1}{aH} u_{\rm g\parallel} ("_{\parallel}" \text{ is the line-of-sight component})$$

number conservation $n_{g}^{S}(\mathbf{s})d^{3}\mathbf{s} = n_{g}(\mathbf{x})d^{3}\mathbf{x} \rightarrow 1 + \delta_{g}^{S}(\mathbf{s}) = \frac{1 + \delta_{g}(\mathbf{x})}{1 + \frac{1}{2H}\frac{\partial u_{g\parallel}}{\partial \mathbf{x}}}$ line of sight $\simeq \left[1 + \delta_{\rm g}({\bf x})\right] \left[1 - \frac{1}{aH} \frac{\partial u_{\rm m\parallel}}{\partial x_{\parallel}}\right] \text{peculiar velocity field} \\ \text{is free from galaxy bias}$

If we assume linear theory, $\delta_{g}^{S}(\mathbf{k}) = \delta_{g}(\mathbf{k}) + f\mu^{2}\delta_{m}(\mathbf{k})$

Here we used
$$\mathbf{k} \cdot \hat{\mathbf{n}}_{\text{los}} = k\mu$$
, $i\mathbf{k} \cdot \mathbf{u}_{\text{m}} = a \frac{\partial \delta_{\text{m}}}{\partial t} = a \frac{d \ln D}{dt} \delta_{\text{m}}$, $f \equiv \frac{d \ln D}{d \ln a}$

 \mathbf{u}_{gr}

Power of spec-z galaxy survey: RSD (cont'd)

• Linear theory prediction of redshift-space power spectrum
$$\begin{split} \delta^S_{\rm g}(\mathbf{k}) &= \delta_{\rm g}(\mathbf{k}) + f\mu^2 \delta_{\rm m}(\mathbf{k}) \\ &\rightarrow P^S_{\rm gg}(k,\mu) = \langle |\delta_{\rm g}(\mathbf{k})|^2 \rangle + 2f\mu^2 \langle \delta_{\rm g}(\mathbf{k}) \delta_{\rm m}(\mathbf{k}) \rangle + f^2 \mu^4 \langle |\delta_{\rm m}(\mathbf{k})|^2 \rangle \\ &= P_{\rm gg}(k) + 2f\mu^2 P_{\rm gm}(k) + f^2 \mu^4 P_{\rm mm}(k) \end{split}$$

If we assume linear bias (b1) ...

$$\begin{aligned} P_{\rm gg}(k) \propto b_1^2 \sigma_8^2 \\ f \mu^2 P_{\rm gm}(k) \propto b_1 f \sigma_8^2 \\ \to f \sigma_8 \end{aligned}$$

- So RSD can eliminate bias uncertainty (b1), and the analysis usually constrain f*sigma8
- However, only this combination is measured (sigma8 alone CANNOT be measured, with this method)

$$P_{\ell}(k) \propto \int \mathrm{d}\mu \ P(k,\mu) \mathcal{L}_{\ell}(\mu)$$

0.6

0.3

0.5 0.5 $(z)\Omega^8(z)$



Challenges with redshift-space galaxy P(k) cosmology: Nonlinearities



- Directly measure the redshift-space power spectra of halos (halos = places where galaxies would form)
- Run N-body simulations
 ⇒ Identify halos
 - ⇒ Make redshift-space mapping
 - ⇒ Measure power spectrum
- Linear Kaiser RSD quickly breaks down, at k>0.05h/Mpc (solid lines show linear theory prediction)

 $P_{\ell}(k) \propto \int \mathrm{d}\mu \ P(k,\mu) \mathcal{L}_{\ell}(\mu)$

Method used in SDSS BOSS collaboration

• Perturbation theory of LSS (also see Leonardo's talk)

$$\delta_{\rm m} = \delta_{\rm m}^{(1)} + \delta_{\rm m}^{(2)} + \delta_{\rm m}^{(3)} \cdots$$
$$\theta = \hat{\mathbf{k}} \cdot \mathbf{u} = \theta^{(1)} + \theta^{(2)} + \theta^{(3)} + \cdots$$
$$\delta_{\rm g} = b_1 \delta_{\rm m} + \frac{b_2}{2} \delta_{\rm m}^2 + \frac{b_s}{2} s_{\rm m}^2 + \cdots$$

 $P_{\rm gg}(k,\mu) = \exp[-(fk\mu\sigma_v)^2] \left[P_{\rm g,\delta\delta}(k) + 2f\mu^2 P_{\rm g,\delta\theta}(k) + f^2\mu^4 P_{\theta\theta}(k) + b_1^3 A(k,\mu,f/b_1) + b_1^4 B(k,\mu,f/b_1) \right]$

- Beutler et al (BOSS collaboration 2017) used the PT based model of Taruya, Nishimichi & Saito (2010: TNS)
- PT method should work for any type of galaxies
- However, Beutler et al. evaluated the nonlinear k-kernels (up to 2-loop terms) at the fiducial LCDM model, and varied only the following parameters in the likelihood analysis in a multi-dimensional parameter space, due to the computational limitation

$\left\{b_1\sigma_8, b_2\sigma_8, \sigma_v, N, \mathbf{f}\sigma_8, \alpha_{\parallel}, \alpha_{\perp}\right\}$

for each redshift slice, ~30 parameters in total





- The forward nonlinear model under LCDM framework, which can work in the nonlinear regime, should give more constraining power due to the stronger cosmological dependences and allow us to measure sigma8 and f separately (f is also specified by cosmological parameters, e.g., $f \simeq \Omega_{\rm m}(z)^{0.55}$)
- More cosmological information by going to the higher kmax⁼(the information content in Fourier space is proportional to k_max^3); so far, kmax~0.15h/Mpc
- The full-shape cosmology analysis was finally done, very recently, by several independent groups: Princeton group (Ivanov, Simonovic, Zaldarriaga+20), Stanford group (Senatore, D'Amico+20), Japan group (Kobayashi, Nishimichi+21), and Berlekey group (Chen, Vlah & White 21)

Challenges for upcoming galaxy survey cosmology

- Need to be prepared for ongoing and upcoming galaxy surveys (DESI, Subaru PFS, Euclid and Roman Space Telescope)
- Cannot yet model "galaxies" from first principles
- Need both "accurate" theoretical template and "robust" method
 - "accurate": accurately model the redshift-space clustering of galaxies, including nonlinear clustering, nonlinear RSD and nonlinear bias
 - "robust": need an "unbiased" estimate of the underlying cosmological parameters, by minimizing the systematic errors due to theory inaccuracy/limitation (e.g. galaxy bias)
- Possible options
 - Cosmological hydrodynamical simulations: still very expensive (and uncertainties in subgrid physics)
 - Perturbation theory (EFTofLSS): see Leonardo's talk
 - Emulation approach of halo model (this talk)



Blinded cosmology challenge

Nishimichi+ (incl. MT) 21



EFTofLSS should be correct/work



M. Zaldarriaga (IAS, Princeton)







M. Ivanov (NYU)



Leonardo Senatore + others (KIPAC, Stanford)

Blinded cosmology challenge: Nishimichi+21

- Japan team's role: prepared BOSS-like mock power spectrum data, without telling which cosmological model was assumed
 - Used N-body simulations, and then populate BOSSlike galaxies
 - Volume ~600 (Gpc/h)^3 ≈100 V_BOSS: minimize statistical noise due to sample variance, to assess the accuracy of the method
 - Mock data include: nonlinear bias, nonlinear RSD, Alcock-Paczynski effect ($\Omega_{\rm m}^{\rm (fid)}=0.3~$ was assumed, which was informed to the analysis teams)
 - $f_{\rm b}\equiv\Omega_{\rm b}/\Omega_{\rm m}=0.1571, n_s=0.9649~~{\rm are~fixed,~and}~~{\rm were~informed~to~the~analysis~teams}$



Blinded cosmology challenge: Nishimichi+21

- East/West coast teams: the two teams analyzed the mock data to address whether the method recovers the cosmological parameters in the simulations
 - Both teams used EFTofLSS including up to 1-loop correction, but employed different parametrization and different prior ranges

$$P_{\ell}(k) = P_{\ell}^{\text{tree}}(k) + P_{\ell}^{\text{1loop}}(k) + P_{\ell}^{\text{ctr}}(k) + P_{\ell}^{\nabla_{z}^{4}\delta}(k)$$

counter terms

- Model parameters: 3 cosmological parameters (As, H0, Omega_m) + many nuisance parameters $b_1, b_2, b_{\mathcal{G}_2}, P_{\text{shot}} + c^{(0)}_{\nabla^2 \delta}, c^{(2)}_{\nabla^2_z \delta}, c^{(0)+(2)}_{\nabla^2_z \delta}$
- Agreed beforehand that the results are NOT changed after unblinding and publish whatever the results are, in the journal
- This level blinded analysis is for the first time

EFTofLSS has a better control of the next-order corrections

Monopole contributions



EFTofLSS works! (BAO is powerful)



After this study, both East/West team published many papers for the cosmology analysis results of real BOSS data

Our approach: Simulation-based halo model approach (Kobayashi, Nishimichi, MT et al. 20/21)



- Galaxies from in "dark matter halos" (this would be especially true for BOSS galaxies)
- Dark matter halos are relatively easy to simulate with N-body simulations (no need of hydrosims)
- Baryonic effects are "local" (< a few Mpc): mass and momentum are conserved on the larger scales

aim to accurately simulate position and bulk velocity of each halo

Galaxy-halo connection

- From weak lensing measurements, we know BOSS galaxies reside in relatively massive halos with ~10¹³Msun mass that are easy to simulate
- Typical velocity dispersions of BOSS galaxies inside halos are ~200km/s (Hikage & Yamamoto 13)
- A few % of BOSS galaxies are satellites residing in cluster-scale halos with ~10¹⁵Msun (only up to ~10 BOSS galaxies in the same halo) (the rest are centrals)
 - Bulk motion of halos can be accurately simulated
 - International velocities (virial motions) of galaxies are very difficult to accurately model
 - RSD effect due to virial motions of galaxies Fingers-of-God effect – is impossible to accurately model

$$\Delta x_{\parallel} \sim \frac{v_{\rm vir}}{aH} \sim 20h^{-1} {\rm Mpc} \left(\frac{v_{\rm vir}}{2000 \,{\rm km/s}}\right)$$

A few % of satellite BOSS galaxies lead to systematic effects on k scales relevant for cosmology inference



Dark Quest (Nishimichi+19)

- Campaign to run high-resolution N-body simulations for flat-geometry wCDM cosmologies
 - 6 parameters: $\mathbf{p} = \{\omega_{\rm b}, \omega_{\rm c}, \Omega_{\rm de}, \ln(10^{10}A_{\rm s}), n_{\rm s}, w_{\rm DE}\}$
 - 101 wCDM models: fiducial Planck cosmology + 100 models, sampled by Sliced Latin Hypercube Design
 - N-body simulations for each model: N_p=2048³, for a volume of either 1 or 2 (Gpc/h) size (note: multiple realizations for Planck cosmology)
 - Identify halos in each output, by Rockstar, and define "central halos" based on the spherical-overdensity definition
 - Halos with $M > 10^{12} Ms/h$, 0 < z < 1.5
 - A few 100TB data in total
- Dark Emulator for real-space halo quantities is publicly available (Nishimichi+21): <u>https://github.com/DarkQuestCosmology/dark_e</u> <u>mulator_public</u> (>5,000 downloads!)



Dark Emulator for redshift-space halo P(k)

Kobayashi et al. 20

- Yosuke's PhD project at U. Tokyo
- Built dataset of redshift-space power spectrum of halos
 - Identify halos in each simulation realization, at each redshift output
 - Make redshift-space mapping
 - Measure redshift-space power spectra from the halo catalog in each realization
- Constructed the training datasets: 80 cosmological models, 21 redshifts, 10 halo bins ⇒ 168,000 instances



Dark Emulator (Kobayashi+20)

- Use a ML neural network to perform a multi-dimensional regression of the redshift-space halo power spectrum: we built "emulator" of $P_{\rm hh}(k,\mu;M_1,M_2,z,{\bf p}_{\rm cosmo})$
- Output P_hh in a 0.1sec for an input set of parameters, enabling parameter inference in a multi-dimensional parameter space
 - 620 (k,mu)-bins (31 k-bins × 20 mu-bins)
- Used validation datasets for 20 cosmological models
- Accuracies: monopole<1% and quadrupole: <5%, achieved, up to k=0.6 h/Mpc
- Switch to the linear theory prediction at very small k, where the sample variance of simulations is significant
- Dark Emulator for redshift-space halo power spectrum includes various nonlinear effects: BAO features, nonlinear clustering, nonlinear RSD, nonlinear bias, halo exclusion effect (effect of finite halo size)



From halos to galaxies in Dark Emulator

• Use the "halo model picture" (Seljak01; White01) to make model predictions of galaxy P(k) from the emulator: redshift-space galaxy power spectrum is given by the weighted sum of the halo spectrum



$$P_{gg}(k,\mu;\mathbf{p}_{cosmo},\mathbf{p}_{nuisance},z) = P_{gg}^{2h} + P_{gg}^{1h}$$
$$= \sum_{M_1,M_2} w(M_1)w(M_2)P_{hh}^S(k,\mu;\mathbf{p}_{cosmo},z,M_1,M_2)F(k,\mu;M_1)F(k,\mu;M_2) + P_{gg}^{1h}(k,\mu)$$
red: carry cosmological dependence from Dark Emulator

blue: nuisance functions to model uncertainties in galaxy-halo connection

- Dark Emulator outputs P_gg in O(0.1) sec
- Philosophy: introduce a sufficient number of nuisance parameters to model uncertainties in galaxy-halo connection (galaxy bias), and then estimate cosmological parameters after the marginalization

Full-shape cosmology analysis of BOSS with Dark Emulator



Full-shape cosmology analysis of BOSS with Dark Emulator

Kobayashi, Nishimichi, MT+21

- BOSS DR12: 0.2<z<0.75
- 5 cosmo parameters with BBN prior on w_b and Planck prior on n_s
- 7 nuisance parameters for galaxy-halo connection, for each sample (we analyzed 4 samples)
- Wider prior on each of galaxy-halo connection parameters
- $5+7 \times 4 = 33$ parameters in total
- Dark Emulator can give a good fit to the data, up to ~0.3h/Mpc



Validation of cosmology analysis pipeline

• Applied the analysis pipeline to the mock signal of power spectrum to check whether the method can recover the cosmological parameters; passed successfully!





Results for real data after marginalization, for ACDM model



- Minimum use of CMB information: only for ns (BBN prior on wb)
- Broad priors of nuisance paras
- Include BAO, AP, RSD, broad-band shape
- Achieved ~5% precision of σ₈ determination (not for fsigma8)
- A slight tension for σ_8 , compared to Planck

Parameter	MAP	Median	68% CI	Planck 68% CI
$\ln(10^{10}A_{\rm s})$	2.931	3.012	$3.014\substack{+0.0886\\-0.0869}$	3.045 ± 0.016
$\Omega_{ m m}$	0.2997	0.3016	$0.3008\substack{+0.0122\\-0.0113}$	0.3166 ± 0.0084
$H_0[{ m kms^{-1}Mpc^{-1}}]$	68.34	68.18	$68.16\substack{+1.40 \\ -1.43}$	67.27 ± 0.60
σ_8	0.7540	0.7855	$0.7859\substack{+0.0361\\-0.0368}$	0.8120 ± 0.0073
$S_8\equiv\sigma_8(\Omega_{ m m}/0.3)^{0.5}$	0.7536	0.7873	$0.7837\substack{+0.0477\\-0.0420}$	0.834 ± 0.016
$f\sigma_8(z_{ m eff}=0.38)$	0.4735	0.4708	$0.4665\substack{+0.0345\\-0.0278}$	0.4771 ± 0.0066
$f\sigma_8(z_{ m eff}=0.61)$	0.4335	0.4344	$0.4296\substack{+0.0337\\-0.0261}$	0.4696 ± 0.0053



- Not much cosmological information at kmax>0.2h/Mpc (galaxy-halo parameters are tightened)
- Some systematic trend with kmax=0.3





Comparison with EFTofLSS results

Kobayashi+ (Emulator): $\sigma_8 = 0.786^{+0.036}_{-0.037}$ $\Omega_m = 0.301^{+0.012}_{-0.011}$ $H_0 = 68.2 \pm 1.4$ Princeton (Philcox+21): $\sigma_8 = 0.737^{+0.040}_{-0.044}$ $\Omega_m = 0.312^{+0.011}_{-0.012}$ $H_0 = 68.5^{+1.1}_{-1.3}$ Berkeley (Chen+21): $\sigma_8 = 0.738 \pm 0.048$ $\Omega_m = 0.305 \pm 0.01$ $H_0 = 68.5 \pm 1.1$

All these are based on the same (at least very similar) data and the similar priors

- Planck sigma8≈ 0.81 ± 0.007
- More stringent than the linear-theory like method (e.g., Beutler, 10% precision in fsigma8)
- Our method achieved the tightest constraint for sigma8, because our method should be based on more restrict model (halo model+Emulator) compared to EFTofLSS
- Our method is still conservative because we did not include any information on the mean host halo mass of BOSS galaxies, nor the mean number density
- In other words, there are a lot of rooms in the improvement: e.g. combine with HSC weak lensing (future plan)





The new Subaru HSC weak lensing result

- New results: cosmological constraints, robust to photo-z errors (Miyatake+21)
- Used Dark Emulator for the theoretical template

$$\gamma(\boldsymbol{\theta}, z_{\mathrm{s}}) \sim \int_{0}^{z_{\mathrm{s}}} \mathrm{d}z \ W(z, z_{\mathrm{s}}) \bar{\rho}_{\mathrm{m}} \delta_{\mathrm{m}}(z, \chi \boldsymbol{\theta})$$





 Auto projected (not 3D) correlation of spectroscopic SDSS galaxies

 $\langle \delta_{\rm g}(z_{\rm l}) \delta_{\rm g}(z_{\rm l}) \rangle \rightarrow \xi_{\rm gg}(r; z_{\rm l}) \simeq b_{\rm g}^2 \xi_{\rm mm}(r; z_{\rm l})$

 Combining these two allows to observationally disentangle galaxy bias uncertainty and matter correlation function





(IPMU)

Hironao Miyatake (Nagoya U.)



- ✓ HSC-Y1 at Ω_m ~0.3 still indicates a tension with Planck?
- ✓ The upcoming HSC Year 3 data promises a significant improvement in cosmological parameters
- The constraint on S8 is not changed even if treating residual photo-z bias as a free parameter (other weak lensing surveys assume ~1% prior on photo-z, and uses COSMOS calibration)

HSC team is now working on Year 3 dataset (a factor of 4 larger dataset) (Miyatake, Sugiyama, MT+)

Subaru Prime Focus Spectrograph

Spectrograph System (SpS)

Prime Focus Instrument (PFI)



- ~\$90M project, being led by • Kavli IPMU (PI: Hitoshi Murayama, PM: Naoyuki Tamura, PS: MT)
- Institutes in 6 countries are involved (US, France, Taiwan, Brazil, Germany, China)
- Mentioned in several places of US Astro2020
- 2400 fibers, wide field-of-view, • 8.2m collecting power
- Envision we will start our large-scale surveys, from early 2024
- PFS blog: • https://pfs.ipmu.jp/blog/ja/



summary

- Spec-z galaxy survey cosmology uses 3D Fourier information a huge potential
- Independent groups are now making efforts to put galaxy survey cosmology at comparable level (robustness and precision) to that of CMB (see Leonardo's talk)
- Nonlinear clustering information, if reliably used, can boost the constraining power of cosmological parameters
- Stringent test of LCDM model address whether a sigma8 tension is a hint of new physics
- We (being led by Takahiro and Yosuke) developed "Dark Emulator" for redshift-space halo power spectrum – eventually made public
- Subaru PFS (~\$80M!) will be online in 2024 exciting era to have Stage IV experiments together with DESI, Euclid, Roman
- Need more neat ideas/method/theory discovery potential/opportunities for you!