# Large Scale Structure II

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RESCEU/ DENET summer school, Kyushu, Japan

# 3 Lectures

- Dark Energy, Baryon Acoustic Oscillations and more
- Observational Cosmology in Action
- A new large scale structure tracer:
  - Lyman alpha forest

# Quick reminder of last lecture

Large scale structure exists in our real universe. There are voids, clusters, web-like features.



First Detection of this standard ruler: Baryon Acoustic Oscillations



Eisenstein et al. 2005

We measure non-linear galaxy powerspectrum in redshift space instead of linear dark matter power-spectrum in real space



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## And the next day, facebook changes...

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All over the world, we have many facebook profile changes....



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- Motivations
- How can we use large scale structure to learn about the Universe?
  - Early Universe (with large scale clustering)
  - Dark Energy (with Baryon Acoustic Oscillations)
- Worked Example of Angular clustering
  - With Luminous Red galaxies



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There is more !! such as testing modified gravity using a combination of clustering + weak lensing (Reyes, Mandelbaumn et al. 2010) [Please refer to Roy's next lecture]



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What happened at the Very Beginning of the Universe?

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## **Non-Gaussianities in early Universe**





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## **Non-Gaussianities in early Universe**





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## What is a tracer of LSS?

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## Let's take a look at the following example.

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## The population density map of Japan 日本統計地図

#### Statistical Maps of Japan

#### 平成12年国勢調査

2000 POPULATION CENSUS OF JAPAN

都道府県・市区町村別人口密度(1km当たり人口)

Population Density by Prefecture and by Shi.Ku.Machi and Mura (population per square kilometer)





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### The 3D power-spectrum of galaxies



JRY

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### Angular Power-spectrum





Slosar, Hirata, Seljak, SH, Padmanabhan 2008 Xia, Baccigalupi, Mattarese, Verde, Viel 2011 Xia et al. 2010

**rrrr** 




# Motivations

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How do we detect Baryon Acoustic Oscillations? We calculate the correlation function or its Fourier Transform: power-spectrum



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What is the correlation function?

$$\xi_f(r) = \langle \delta_f(\hat{x})\delta_f(\hat{x}+\hat{r}) \rangle$$



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#### Looking at a typical American family



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   With Luminous Red galaxies

## **BAO: with Luminous Red Galaxies** Physics of Angular Clustering







Galaxy angular power-spectrum  

$$C_l^{gg} = \int dz \frac{H_0}{c} b^2(z) (dN/dz)^2 D^2(z) P(\frac{l+\frac{1}{2}}{\chi})$$

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#### BAO: with Luminous Red Galaxies Physics of Angular Clustering





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## BAO: with Luminous Red Galaxies Physics of Angular Clustering



Galaxy Angular power-spectrum contains a wealth of cosmological information ranging from

a) What is **dark energy**? to

b) What happened at the very early Universe? Inflation? What kind?

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- BAO
- Overall shape of the spectrum

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inflationary parameters affect the largest scale



#### BAO: with Luminous Red Galaxies The Data



## Total Area: 14,555 sq deg

1.5 million LRGs: 0.4<z<0.7



note: Colors only indicates the when a certain area of the sky is surveyed.

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#### **BAO: with Luminous Red Galaxies** The Data: Splitting them into redshift bins

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• For each of the redshift bin, we cross-correlates the Luminous Red Galaxies with themselves, and we get the angular power-spectra of the galaxies.

- We want the best measurement of the angular power-spectra possible, from the stand point of not only statistical error, but also systematic errors.
- To get the best statistical errorbar, we apply "Quadratic Estimator", which are proven to provide:
  - Unbiased Minimum variance measurement of the parameters that are being estimated if the field is gaussian.
  - Many people have worked on this Quadratic Estimators: Hamilton, Tegmark, Bond, Jaffe and Knox, White, Padmanabhan, Hirata, Blake, et al.



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- But in order to derive cosmological constraints, we need to be able to predict the angular power-spectra given any cosmological models.
- That's why: we need the **theory**:

$$C_{l}^{gg} = \int dz \frac{H_{0}}{c} b^{2}(z) (dN/dz)^{2} D^{2}(z) P(\frac{l+\frac{1}{2}}{\chi})$$



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 Given a cosmological model, we can predict the theory, except we need two inputs: bias b(z) and redshift distribution dN/dz.

## **BAO: with Luminous Red Galaxies** The Data: Redshift distribution



SDSS III has been taking spectra of all of these photometric LRGs, therefore, we have an unbiased spectroscopic confirmation of the photometric redshifts for  $\sim 10\%$  of the sample, therefore, we have very good understanding of the redshift distribution of the sample.





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# What we expect to see

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#### BAO: with Luminous Red Galaxies Systematics



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- Therefore, the systematics I am going through here are mostly for getting a clean angular power-spectrum which contains other information such as the shape of matter power-spectrum, scale dependent bias that can be caused by non-gaussianities at the early Universe.

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## Short summary:





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# **Systematics**

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# Can we restrict ourselves to certain I-modes?

$$C_l^{gg}(Data) = C_l^{g_{real}g_{real}} + \epsilon_1 C_l^{stars,stars} + \epsilon_2 C_l^{sky,sky} + \epsilon_3 C_l^{c,c} + \dots$$
  
Real Galaxy Power Stars Sky Brightness Color Offset

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## Effect of stars

**rrrr** 



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# The effect of sky brightness

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Real Galaxy Power Stars Sky Brightness Color Offset



#### **Color offsets**



#### DR8 Color offsets in g-r



#### These are color (difference in magnitudes) zero points of SDSS

Color offsets as discussed in Schlafly et al. 2010

#### The effect of the color offsets



**rrrr** 



#### What can we do when we can't/ don't want to cut to a certain l-range?

### Systematics: Taking them out of the equation



We also need to take into account of all the covariances between systematics and across different band power

SH, Ross, Cuesta, Seo, White, Schlegel et al. (in prep)

#### In configuration space: Auto-correlation functions





People has made claims on extra power in large scales and that it points to primordial non-gaussianities, but it can be explained away by systematics we just talked about





## **Remember? What we expect to see**

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#### **BAO: with Luminous Red Galaxies** Preliminary Results before taking out systematics



It is really hard to see the BAO feature, but one can divide out the smooth part of the spectrum

SH, Seo, Ross, White, Schlegel et al. (in prep)

#### **BAO: with Luminous Red Galaxies** Preliminary BAO before taking out systematics

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#### **BAO: with Luminous Red Galaxies** Preliminary BAO before taking out systematics





#### **BAO: with Luminous Red Galaxies Preliminary BAO before taking out systematics**

1.6

1.4

 $C_{l}/C_{l,sm}$ 

0.8

0.6

10

z=0.5-0.55 SH, Seo, Ross, White, Schlegel et al. (in prep) lrg8 z=0.5-0.55 a0b0,  $\alpha = 1.125$ ,  $\chi^2 = 136.4$ z=0.55-0.6 lrg9 z=0.55-0.6 1.4  $\theta_{\rm BAO,obs} = \theta_{\rm BAO,fid} / 1.15$  $3.2\sigma$ 1.2100 100  $C_{\rm l}/C_{\rm l,sm}$ 1 z=0.6-0.65 0.8 lrg10 z=0.6-0.65 1.4  $3.8\sigma$  $\theta_{\rm BAO,obs} = \theta_{\rm BAO,fid} / 0.99$ 0.6 1.2 100 1000 10  $C_{\rm l}/C_{\rm l,sm}$ 0.8 However, there may still be small  $2.6\sigma$ 0.6 remaining systematics in higher 1... 10 100 100

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#### **BAO: with Luminous Red Galaxies** Systematics: Taking them out of the equation



We also need to take into account of all the covariances between systematics and across different band power

Awaiting for the new answers ...

SH, Seo, Ross, White, Schlegel et al. (in prep)





(if you really want to know)

## The following results are derived:

by taking into account of angular power-spectra from I >40 from z=0.45-0.65.

It should be quite clean of systematics, but there are probably some residuals which we are going to take out with our new method.

# Preliminary results without taking out all of the systematics

We look at the difference in chi-square for BAO and no-BAO models







• Data: Largest volume ever used for galaxy clustering: 14,000 sq deg up to z=0.7, this is equivalent to  $15 {
m Gpc}^3$ 



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- Method: First application of Quadratic Estimator on all redshift slices for BAO while taking into account of all the correlations between different redshift slices of galaxies.
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- Detection:

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  - Unbiased minimum variance measurement with various systematics taken into account.
- Detection:
  - This work: Significant Detections at high redshift range: 0.45<z<0.65 (competitive to constraints from spectroscopic survey WiggleZ [Blake et al. 2011])

### BAO: with Luminous Red Galaxies Looking forward



- Cosmological Constraints from BAO will be coming soon.
- More detailed systematic tests have to be carried out.
- Photometric LRGs can be used for BAO in upcoming surveys such as DES, PanStarrs and LSST.
- A variant of the Quadratic Estimator can be applied to any Spectroscopic LRGs (in SDSS III-BOSS, BigBOSS, SuMire-PFS, WFIRST...) will provide < 10% constraint on equation of state of Dark Energy.

## **BAO: Beyond Galaxies**



How can we learn about cosmology at much higher redshift ?





## Next lecture ...

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- Observational Cosmology in Action
- A new large scale structure tracer:
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## **End of slides**







Courtesy simulation of gas from Renyue Cen and Jerry Ostriker

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Locates the Neutral Hydrogen of the Universe, thus tracing overdensities of the Universe flux omiecio Dark Energy Plate 3536, Fiber 00 Accelerated Expansion 25 Afterglow Light Juasar Pattern Dark Ages Development of z = 2.669Sped BS-20 400,000 yrs. Galaxies, Planets, etc. 15 Lya 21216 Inflation N V λ1240 10 Si IV 21400 C IV 21549 5 0 000 Quantum Fluctuations C III ) 2326 He II ).1640 D VI 21035 2000 1st Stars about 400 million yrs. **Big Bang Expansion** 13.7 billion years 4400 4600 5600 5800 6200 6800 7000 7200 4200 6000

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### Beyond: With Lyman Alpha Forest What is it?

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### Beyond: With Lyman Alpha Forest Simulations: Resolution Effects?



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### BAO: with Luminous Red Galaxies Systematics



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**Color offsets:** We compute cross-correlations between all of the photometric offsets (from Schlafly et al. 2010)

$$C_l^{gg}(\text{DATA}) = b^2 C_l^{\delta_m \delta_m} + C_l^{d,d} + C_l^{s,s} + C_l^{g(z),g(z')} + .$$

### **Dust Extinction:**

We cross-correlate the extinction map (SFD) with the galaxies to see if there is any correlations. Stellar Contamination: We cross-correlate the stellar density maps (generated from SDSS) with the galaxies. Galaxies from next photometric slice: We compute all the correlations between different redshift slices, and take into account of the covariances and correlations between different slices.

### The effect of dust extinction



**rrrr** 

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We cross-correlate the extinction map (SFD) with the galaxies to see if there is any correlations. Stellar Contamination:

We cross-correlate the stellar density maps (generated from SDSS) with the galaxies. Galaxies from next photometric slice:

between all of the photometric offsets (from Schlafly et al.

We compute all the correlations between different redshift slices, and take into account of the covariances and correlations between different slices.

### The effect of stars





### BAO: with Luminous Red Galaxies Systematics



- The Reason why BAO become so popular is that it is one of the cleanest probe of cosmology, since there are not that many systematics that can cause a shift in BAO scale (~100 Mpc)
- Therefore, the systematics I am going through here are mostly for getting a clean angular power-spectrum which contains other information such as the shape of matter power-spectrum, scale dependent bias that can be caused by non-gaussianities at the early Universe.

**Color offsets:** We compute cross-correlations between all of the photometric offsets (from Schlafly et al. 2010)

 $C_l^{gg}(\text{DATA}) = b^2 C_1^{\delta_m \delta_m} + C_1^{d,d} + C_1^{s,s} + C_1^{g(z),g(z')} + \dots$ 

**Dust Extinction:** 

We cross-correlate the extinction map (SFD) with the galaxies to see if there is any correlations. Stellar Contamination: We cross-correlate the stellar density maps (generated from SDSS) with the galaxies.

# Galaxies from next photometric slice:

We compute all the correlations between different redshift slices, and take into account of the covariances and correlations between different slices.

# **Overlap of the redshift bins**

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### What are the photometric offsets?

These are the "zero points" of colors (difference in magnitudes) of the survey, but they are not zero!



Color offsets as discussed in Schlafly et al. 2010

# The effect of the photometric offsets

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### **Motivations**





### **Motivations**





### **Motivations**







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### Beyond: With Lyman Alpha Forest Redshift space distortions



#### **Beyond: With Lyman Alpha Forest Redshift space distortions** z-space distortions No z-space distortion COMMENCE Ē Apply linear Kaiser formula 60 140 120 $\xi(r,\mu) = \sum L_\ell(\mu) \xi_l(r),$ 100 $\ell = 0.2.4$ c/h) 80 $\xi_0(r) = C_0 \xi_{\mathrm{R}}(r),$ $\xi_2(r) = C_2\left(\xi_{\mathrm{R}}(r) - \bar{\xi}(r)\right),\,$ 60 160 140 $\xi_4(r) = C_4 \left( \xi_{\mathrm{R}}(r) + 2.5 \overline{\xi}(r) - 3.5 \overline{\overline{\xi}}(r) \right),$ 40 120 100 80 60 20 40 20 $\mu = r_{par}/|\vec{r}|$ r\_par (Mpc/h) $C_i = f_i(\beta)$ $\beta = dln\delta/dlna = \Omega_m^{0.6}$

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### Beyond: With Lyman Alpha Forest Redshift space distortions




### Beyond: With Lyman Alpha Forest Redshift space distortions



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#### Beyond: With Lyman Alpha Forest Redshift space distortions



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### Beyond: With Lyman Alpha Forest Possible systematics



- UV background fluctuations
- Metal Line contaminations
- Continuum fitting errors
- Damped Lyman alpha systems
- Broad Absorption Line systems

# Lyman Alpha Forest: what can it do?





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#### Beyond: With Lyman Alpha Forest Mini Conclusion



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#### Beyond: With Lyman Alpha Forest Mini Conclusion



BigBOSS Lyman-alpha forest (4-6 times more QSOs) will make even better measurement of DE at z >2!

40	60	80	100	120	140	40	60	80	100	120	140
$r_{\perp}$						$r_{\perp}$					



- New program for the SDSS telescope for 2008–2014 (already working and providing data!).
- Definitive study of the low-redshift acoustic oscillations. 10,000 deg<sup>2</sup> of new spectroscopy from SDSS imaging.
  - 1.5 million LRGs to z=0.8, including 4x more density at z<0.5.
  - 7-fold improvement on large-scale structure data from entire SDSS survey; measure the distance scale to 1% at z=0.35 and z=0.6.
  - Easy extension of current program.
- Simultaneous project to discover the BAO in the Lyman α forest.
  - 160,000 quasars. 20% of fibers.
  - 1.5% measurement of distance to z=2.3.
  - Higher risk but opportunity to open the high-redshift distance scale.





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Volume of the Universe probed by SDSS



Courtesy plots from Michael Blanton

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Volume of the Universe probed by SDSS

Volume of the Universe probed by BOSS



Courtesy plots from Michael Blanton

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#### Volume of the Universe probed by SDSS



#### Volume of the Universe probed by BOSS



#### Courtesy plots from Michael Blanton

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#### Beyond: With Lyman Alpha Forest Mini Conclusion



even better measurement of DE at z > 2!

#### Science Goals: 50 million redshifts



Sensitivity to new physics scales as volume surveys -- # of modes



Courtesy Slide from David Schlegel

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- Motivations
- Introduction
  - What are Baryon Acoustic Oscillations?
- Baryon Acoustic Oscillations: Now and Beyond
  - Now: With Luminous Red Galaxies
  - Beyond: With Lyman Alpha Forest
- Conclusions



- Baryon Acoustic Oscillations is one of the cleanest probes of Dark Energy
- We made the minimum variance measurement of galaxy clustering for largest volume of galaxies ever used for clustering
- Allowing us to make significant detection of BAO at z=0.45-0.65, the highest redshift range BAO is ever detected significantly.
- Looking forward, we can apply the same optimal method to both photometric and spectroscopic surveys such as DES, LSST, BOSS and BigBOSS
- We can also push measurement of BAO to higher redshift via Lyman alpha forest.
- Our results of first simulation of Lya forest BAO signals indicate that Lyman alpha flux provides a good tracer of the underlying dark matter field on large scales, therefore making Lyman alpha forest a well-suited candidate for BAO measurement.



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- 1.2



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# **The End**

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#### Beyond: With Lyman Alpha Forest Mini Conclusion



# What is BOSS? Baryon Oscillation Spectroscopic Survey



- Definitive study of the low-redshift acoustic oscillations. 10,000 deg<sup>2</sup> of new spectroscopy from SDSS imaging.
  - -1.5 million LRGs to z=0.8, including 4x more density at z<0.5.
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# BOSS



12h *`*& цß 0.4 0.6 0.2 Redshift z20h 5 ЧО

Volume of the Universe probed by SDSS

Volume of the Universe probed by BOSS



Courtesy plots from Michael Blanton

### Beyond: With Lyman Alpha Forest Mini Conclusion



Dark Energy via Baryon Acoustic Oscillations



BOSS Lyman-alpha forest will hopefully make the first measurement of Dark Energy at z> 2!

**BigBOSS** Lyman-alpha forest (~6 times more QSOs) will make even better measurement of DE at z >2!

# How do you go about measuring BAO?



 $10^{-1}$ 

- Since there are many ripples, how do we actually measure the BAO?
- We measure the correlation function or its Fourier transform, called the power-spectrum.





#### Science Goals: 50 million redshifts



Sensitivity to new physics scales as volume surveys -- # of modes



Courtesy Slide from David Schlegel

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## Lyman Alpha Forest: what can it do?

### — Non-gaussianities in Early Universe

parameterize how much non-linear corrections are there to the potential

$$\Phi = \phi + f_N L \phi^2$$

Primordial potential (assumed to be gaussian random field)





# Lyman Alpha Forest: what can it do?

### — Non-gaussianities in Early Universe

parameterize how much non-linear corrections are there to the potential

$$\Phi = \phi + f_N L \phi^2$$

Primordial potential (assumed to be gaussian random field)





Inflation


— Non-gaussianities in Early Universe

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Dark Energy via Baryon Acoustic Oscillations





Dark Energy via Baryon Acoustic Oscillations







## What can we do with Lya and fnl?



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## What can we do with Lya and fnl?



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- Redshift space distortions' effect
- Effects of DLAs (Damped Lya systems), BALs (Broad Absorption line systems), Metals
- Effect of incomplete continuum subtractions
- The other systematic error that will be coming from the experiment/analysis.



- Lyman-alpha forest in BOSS and BigBOSS will (hopefully) do the following:
  - Lya BAO to measure Dark Energy at z>2
  - Lya probes non-gaussianity of the Early Universe
  - Other applications:
    - Lya P(k) tighten the cosmological constraints
    - temperature density relation in the IGM
    - finding missing baryons at higher z





FIG. 2: The cross-correlation coefficient between the flux in our low and high resolution boxes,  $\sqrt{\xi_{lh}^2/\xi_{ll}\xi_{hh}}$ . Red points show the result for the two low resolution boxes having twice the smoothing length of the high resolution box, blue is the same for  $4\times$  smoothing length.







 Cosmological Constraints from Lyman-alpha power spectrum





Cosmological constraints from Lyman-alpha power spectrum (with no BAO)

	Planck	Planck + BigBOSS Lya	Planck + BigBOSS Lya + Galaxies
$(\sum m_{\nu})$	0.307	0.048	0.006
$\sigma(\Omega_K)$	0.011	0.0041	0.00038
$\sigma(n_s)$	0.0034	0.0023	0.001
$\sigma(dn_s/dln(k))$	0.003	0.0028	0.0005

Courtesy from Anze Slosar



- Motivations
- Introduction (What is Lyman-alpha forest?)
- What can you do with Lyman-alpha forest?
  - Baryon Acoustic Oscillations -> Dark Energy
  - Lyman-alpha power spectrum
  - Non-gaussianities in Early Universe
- Conclusion

— Non-gaussianities in Early Universe

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## • Simulation boxes of Dark matter

- $3000^3$  particles  $3000^3$  mesh  $1500 \ (h^{-1}Mpc)^3$  on the side  $\Omega_m = 0.25, \ \Omega_{\Lambda} = 0.75, \ h = 0.75, \ n = 0.97, \ \sigma_8 = 0.8$ Fluctuating Gunn Peterson approximation
  - Peculiar velocities included







- Sound speed plummets. Wave stalls at a radius of 150 Mpc.
- Overdensity in shell (gas) and in the original center (DM) both seed the formation of galaxies.

## What are these Sound Waves?

- Each initial overdensity (in DM & gas) is an overpressure that launches a spherical sound wave.
- This wave travels outwards at ~half of the speed of light.
- Pressure-providing photons decouple at recombination. CMB travels to us from these spheres.



Courtesy slide from Daniel Eisenstein



## **Recall? Modeling z-space distortions**



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SH, Slosar & White (in

prep,

## **Recall? Modeling z-space distortions**



The large scale correlation functions from 5% of Lyman alpha forest in BOSS

Recall that we are looking for an enhancement of power at ~110 Mpc/ h?



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SH, Slosar & White (in

prep)

# What can we do with Lya and fnl?

Non-gaussianities in Early Universe



1 xa 21210 N V 21240

10<sup>-43</sup> seconds

VF<sub>2</sub> (arbitrary unit



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particles

????

Planck Era

universe.

Redshift

## Lyman Alpha Forest: what is it?



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#### **Beyond: With Lyman Alpha Forest** Possible systematics: UV background fluctuations

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## Lyman Alpha Forest: what is it?





## Lyman Alpha Forest: what is it?



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- Introduction (What is Lyman-alpha forest?)
- What can you do with Lyman-alpha forest?
  - Baryon Acoustic Oscillations
    - Dark Energy
  - Scale Dependent Bias
    - Primordial Non-gaussianities (f\_nl)
- Conclusion


















### **Motivations**





### **Motivations**





What happened at the Beginning of the Universe?

#### Lyman Alpha Forest: what can it do?

— Non-gaussianities in Early Universe

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#### What are baryon acoustic oscillations (BAO)?

These fluctuations of 1 part in 10<sup>5</sup> gravitationally grow into...



...these ~unity fluctuations today

This sound wave can be used as a "standard ruler"

Dark energy changes this apparent ruler size

Courtesy slide from David Schlegel and animation from Daniel Eisenstein



### **First detections of BAO**



- Motivations
- Introduction (What is Lyman-alpha forest?)
- What can you do with Lyman-alpha forest?
  - Baryon Acoustic Oscillations -> Dark Energy
  - Lyman-alpha power spectrum
  - Non-gaussianities in Early Universe
- Conclusion

# **Predicted signals of BAO**



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#### BAO: with Luminous Red Galaxies Systematics: Dust



- As pointed out by Schlafly, Finkbeiner et al (2010), there is a normalization difference in galactic north and south of ~15%. There is also reddening factor overestimates by factor ~1.4.
- These all possibly contribute to extra power in galaxy power-spectra

## Lyman Alpha Forest: what can it do?







Padmanabhan et al. 2006

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- We start with single perturbation and the plasma is totally uniform except for an excess of matter at the origin
- High pressure drives the gas+photon fluid outwards approaching speed of light.





• This expansion continues for 100,000 years.



- After 100,000 years, the Universe is cool enough that protons capture electrons to form neutral hydrogen
- This decouples the photons from the baryons. The photons quickly streamed away, leaving baryon peak stalled.









• The photons continue to stream away, while baryons, having lost the motive pressure, remain in place.



Eisenstein, Seo and White (2006)

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- The photons are nearly completely uniform now, but the baryons remain overdense in a shell of ~100 Mpc in radius
- In addition, the large gravitational potential well which we started with starts to draw the material back to it.



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- As the perturbation grows, the baryons and dark matter reach equilibrium densities in the ratio of global baryon-to-dark matter ratio.
- The final configuration is our original peak at the center and an 'echo' in a shell roughly 100 Mpc in radius with width ~10%





How do we detect Baryon Acoustic Oscillations? We calculate the correlation functions or its Fourier Transform: power-spectrum

What is the correlation function?

$$\xi_f(r) = <\delta_f(\hat{x})\delta_f(\hat{x}+\hat{r})>$$





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$$f_{NL} = 100$$

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### BAO: with Luminous Red Galaxies Systematics: Dust





