LAPIS 2018: La Plata International School on Astronomy and Geophysics

# "Cosmology in the era of large surveys"

La Plata, Argentina. 23-27 April 2018.

## Large scale structures with Lyman- $\alpha$ forests

Julián Bautista - Institute of Cosmology and Gravitation University of Portsmouth, United Kingdom







# Contents

- Quick summary
- Physics of the Lyman-alpha forest
- Simulating forests in a cosmological context
- Link to large-scale structures
- One-dimensional clustering and neutrino masses
- Three-dimensional clustering, BOSS and BAO
- Near future

Overview of clustering using Lyman-alpha forests (in 10 min?)

Quasar spectrum



Quasar spectrum





Yèche et al. 2017

#### Survey of forests





















## Physics of the Lyman-alpha forest

## Quasars: the back light sources

Quasar observed by the Hubble telescope



So bright that can be up to redshifts ~ 7 !

## Quasars: the back light sources

Quasar observed by the Hubble telescope



So bright that can be up to redshifts ~ 7 !

#### Quasars: the back light sources



#### Hydrogen atom transitions



Lyman limit : 91.2 nm or 13.6 eV









At rest-frame:

 $\lambda_{Ly\alpha} = 121.6 \text{ nm}$  $\lambda_{Ly\beta} = 102.6 \text{ nm}$ 



Isn't it material ejected from quasar?

- huge momentum requirements (Goldreich and Scoville, 1976)
- detection of galaxies at same redshifts as some metal absorbing systems (Bergeron, 1986)
- detecting of low metallicity systems in systems far from the quasar (Petitjean and Bergeron, 1994)

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Therefore, the Lyman-alpha absorption is caused by hydrogen in the InterGalactic Medium (IGM)





The Physics of the Lyman-a Forest: Gunn-Peterson

How much neutral hydrogen is need to explain observations?

Some definitions:



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$$au = \int_{0}^{z_{0}} \mathrm{d} au(z) = \int_{0}^{z_{0}} n_{\mathrm{HI}}(z) \sigma[
u(1+z)] rac{\mathrm{d}l}{\mathrm{d}z} \mathrm{d}z \ (\mathrm{m}^{-3}) \quad (\mathrm{m}^{-2}) \quad (\mathrm{m}^{-2})$$

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3) density of **hydrogen**:

$$\rho_{\rm H}(z) = \rho_b (1 - Y_{\rm He}) \sim 0.76 \rho_b$$
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What is the density of neutral hydrogen  $n_{HI}(z)$ ?

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4) density of **neutral hydrogen**:  $\rho_{\rm HI}(z) = X \rho_{\rm H}(z)$ 

5) number density of **neutral hydrogen atoms**:

$$n_{\rm HI}(z) = X \frac{3H_0^2}{8\pi G} \frac{\Omega_b}{m_p} (1 - Y_{\rm He})(1+z)^3$$

$$\tau = \int_0^{z_0} \mathrm{d}\tau(z) = \int_0^{z_0} n_{\mathrm{HI}}(z)\sigma[\nu(1+z)]\frac{\mathrm{d}l}{\mathrm{d}z}\,\mathrm{d}z$$

The last part: 
$$dl = -cdt = -c\frac{da}{\dot{a}} = \frac{c dz}{(1+z)H(z)}$$

(Gunn & Peterson 1965)

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Approximating the cross-section by a Dirac delta function:

$$\tau(\nu) = \int_0^{z_0} n_{\rm HI}(z) \frac{\pi q^2}{m_e c} f \delta^D [\nu(1+z) - \nu_\alpha] \frac{c}{H(z)(1+z)} \, \mathrm{d}z$$

where f = 0.416 is the oscillator strength of the Ly-alpha resonance.

(Gunn & Peterson 1965)

$$\tau = \int_0^{z_0} \mathrm{d}\tau(z) = \int_0^{z_0} n_{\mathrm{HI}}(z)\sigma[\nu(1+z)]\frac{\mathrm{d}l}{\mathrm{d}z}\,\mathrm{d}z$$

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where f = 0.416 is the oscillator strength of the Ly-alpha resonance.

Assuming: 
$$H_0 = 70 \text{km s}^{-1} \text{Mpc}^{-1}, \Omega_m = 0.27, \Omega_b = 0.045, z = 3$$

$$\tau(z=3)\sim 10^5 X$$

(Gunn & Peterson 1965)

where X is the fraction of hydrogen in neutral form!

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Observations show:  $F(z=3) \sim 0.5X$ 

$$\tau(z=3) \sim 10^5 X$$
 where X is the fraction of hydrogen in neutral form!  

$$F(\lambda) = \frac{F(\lambda)}{\Gamma(\lambda)} = e^{-\tau(\lambda)}$$

Transmission

Continuum

Observations show:  $F(z=3) \sim 0.5X$ 

 $f_{\lambda} [10^{-17} \text{ergs}^{-1} \text{cm}^{-2} \text{Å}^{-1}]$ 

which leads to the conclusion:  $X(z=3) \sim 10^{-5}$ 

$$\tau(z=3) \sim 10^5 X$$
 where X is the fraction of hydrogen in neutral form!  

$$\int_{F(\lambda)}^{F(\lambda)} = \int_{F(\lambda)}^{F(\lambda)} = e^{-\tau(\lambda)}$$
Optical Depth is the fraction of hydrogen in neutral form!

Observations show:  $F(z=3) \sim 0.5X$ 

which leads to the conclusion:  $X(z=3) \sim 10^{-5}$ 

#### The Universe is mostly ionized at z ~ 3! (Gunn & Peterson 1965)

But the amount of neutral hydrogen is enough for Lyman-alpha forest observations!



(Hassan et al. 2018)







(Hassan et al. 2018)







# The Physics of the Lyman-α Forest: Photo-ionization Equilibrium

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Writing Boltzmann equation for the neutral fraction X:

$$\frac{\mathrm{d}X}{\mathrm{d}t} = \alpha_{\mathrm{rec}} n_e (1 - X) - \gamma_c n_e X - \Gamma X$$

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Recombination with free electrons, producing photons

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$$\alpha_{\rm rec} \sim 10^{-13} \left(\frac{T}{10^4 {\rm K}}\right)^{-0.7} {\rm cm}^3 {\rm s}^{-1}$$

Ionization by collisions (only important at T >  $10^{6}$  K)

Ionization by UV background photons (CMB, stars, quasars)

# The Physics of the Lyman-a Forest: Photo-ionization Equilibrium

Writing Boltzmann equation for the neutral fraction X:

$$\frac{\mathrm{d}X}{\mathrm{d}t} = \alpha_{\mathrm{rec}} n_e (1 - X) - \gamma_c n_e X - \Gamma X$$



The evolution of X is a battle between these processes







 At z ~ 20-100, the first stars and galaxies form, increasing the UV background around them.

> Recombination with free electrons, producing photons  $\omega_{m} \sim 10^{-12} \left(\frac{T}{1000}\right)^{-12} \text{ cm}^{1-1}$  Initiation by UV background photons (CMB, stars, quasars)

# $X \to 0$

 $X \to 1$ 



 At z ~ 20-100, the first stars and galaxies form, increasing the UV background around them.



- At z ~ 2-4, the Universe is mostly ionized and the neutral fraction stabilizes to X ~ 10<sup>-5</sup> everywhere\*
  - Recombination with free electrons, producing photons  $\frac{1}{10^{-12}} \left(\frac{T}{10^{12} {\rm k}}\right)^{-6^2} {\rm cm}^{3} {\rm cm}^{-1}$





 $X \to 1$ 



 At z ~ 20-100, the first stars and galaxies form, increasing the UV background around them.



At z ~ 2-4, the Universe is mostly ionized and the neutral fraction stabilizes to X ~ 10<sup>-5</sup> everywhere\*





 $X \to 1$ 

 $X \to 0$ 

Photo-ionization Equilibrium



#### This equation is commonly used in "non-hydro" simulations of Lyman-alpha forests



This equation is commonly used in "non-hydro" simulations of Lyman-alpha forests

Eulerian dark-matter N-body simulations + gas hydrodynamics + galaxy formation + cosmological constant: IGM properties **weakly** dependent on cosmological model (Cen et al., 1994, Petitjean et al., 1995, Miralda-Escudé et al., 1996)





Contours = column densities  $10^{12+i^{*}0.5}$  cm<sup>-2</sup> for i = 0, 1, 2, ...



Smoothed Particle Hydrodynamics (SPH) techniques first introduced by Zhang et al., 1995 and Hernquist et al., 1996



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Smoothed Particle Hydrodynamics (SPH) techniques first introduced by Zhang et al., 1995 and Hernquist et al., 1996



Contours = column densities  $10^{12+i^{*}0.5}$  cm<sup>-2</sup> for i = 0, 1, 2, ...

80-90% of the forests come from low density sheet/filament-like gas structures ("Cosmic Web"). Higher density structures follow dark-matter halos

Temperature-density relation from SPH simulation

Temperature-density relation from SPH simulation



Temperature-density relation from SPH simulation



Departure from equilibrium:

- cooling due to expansion
- adiabatic compression
- shock heating
- other non-linear processes

Temperature-density relation from SPH simulation



Departure from equilibrium:

- cooling due to expansion
- adiabatic compression
- shock heating
- other non-linear processes

Very useful for semianalytical simulations!

#### Link to large-scale structures
- Does the forest trace dark-matter fluctuations?
- Does it follow linear perturbation theory?
- What causes departure from linear theory?

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Majority of forest is low density

$$\delta = \rho/\bar{\rho} - 1 \lesssim 1$$

Clustering mostly follows linear theory on large scales

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Clustering mostly follows linear theory on large scales

 $\begin{array}{l} \text{Observable:}\\ & \text{Optical}\\ F(\lambda) = \frac{F\text{lux}}{f(\lambda)} & \text{Depth}\\ \frac{f(\lambda)}{C(\lambda)} = e^{-\tau(\lambda)}\\ \text{Transmission} & \text{Continuum} \end{array}$ 

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Observable:  

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Transmission
$$\begin{array}{l} \text{Continuum} \\ \text{Continuum} \end{array}$$

Fluctuations:

$$\delta_F = \frac{F}{\bar{F}} - 1$$

$$F(\lambda) = \frac{f(\lambda)}{C(\lambda)} = e^{-\tau(\lambda)}$$

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Density bias

$$b_F = \left. rac{\partial \delta_F}{\partial \delta} 
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Velocity bias

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Density bias

Because of non-linear transformation between F and density, the velocity bias is generally different than one (Seljak 2012)

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Velocity bias

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Density bias

Because of non-linear transformation between F and density, the velocity bias is generally different than one (Seljak 2012)

The forest power-spectrum can be written as:

$$P_F(\vec{k}) = b_F^2 (1 + \beta \mu^2)^2 P_{\text{lin}}(k) D(\vec{k})$$

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Kaiser redshift-space distortions

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Kaiser redshift-space distortions

Linear matter-power spectrum



$$P_F(\vec{k}) = b_F^2 (1 + \beta \mu^2)^2 \frac{P_{\text{lin}}(k)D(\vec{k})}{P_{\text{lin}}(k)D(\vec{k})}$$

Kaiser redshift-space distortions

Linear matter-power spectrum

Non-linear contribution



$$P_F(\vec{k}) = b_F^2 (1 + \beta \mu^2)^2 P_{\text{lin}}(k) D(\vec{k})$$

Kaiser redshift-space distortions

Linear matter-power spectrum

Non-linear contribution

$$D(\vec{k}) = \exp\left\{\left[\frac{k}{k_{\rm NL}}\right]^{\alpha_{\rm NL}} - \left[\frac{k}{k_P}\right]^{\alpha_P} - \left[\frac{k_{\parallel}}{k_V(k)}\right]^{\alpha_V}\right\}$$

from hydro-sims (McDonald 2003)





$$P_F(\vec{k}) = b_F^2 (1 + \beta \mu^2)^2 P_{\text{lin}}(k) D(\vec{k})$$

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from hydro-sims (McDonald 2003)

$$b_F = -0.131 \pm 0.017$$
  $eta = b_\eta/b_F = 1.580 \pm 0.022$ 

Alternate functions determined by Arinyo-i-Prats et al. 2015





Few forests available Measurements of line-of-sight correlations/power spectrum

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First evidences of clustering among absorption lines Sargent et al. 1980, Webb and Malkan 1986, Muecket and Mueller 1987

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Using ~ 50 high-resolution spectra, first measurements of n<sub>s</sub> and  $\sigma_8$  from the 1D power spectrum Croft et al. 1999, McDonald et al. 2000, Croft et al. 2002, Viel et al. 2004



Viel et al. 2004

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Two/three orders of magnitude more quasars in SDSS era. Constraints on n<sub>s</sub>,  $\sigma_8$ , warm dark matter and **neutrino masses** McDonald et al. 2006, Palanque-Delabrouille et al. 2013, Yèche et al. 2017

Few forests available

Measurements of line-of-sight correlations/power spectrum



Two/three orders of magnitude more quasars in SDSS era. Constraints on n<sub>s</sub>,  $\sigma_8$ , warm dark matter and **neutrino masses** McDonald et al. 2006, Palanque-Delabrouille et al. 2013, Yèche et al. 2017 Any attempt to measure the shape of the power-spectrum need simulations to understand the signal

Yeche et al. 2017 use a series of simulations for many combinations of cosmological and IGM parameters (Borde et al. 2014, Rossi et al. 2014, Baur et al. 2016)

Parameter	Value
$\sigma_8(z=0)$	0.83
ns	0.96
$H_0 [{\rm km}~{\rm s}^{-1}{\rm Mpc}^{-1}]$	67.5
$\Omega_{\rm m}$	0.31
$\Omega_{ m b}$	0.044
$\Omega_{\Lambda}$	0.69
$T_0(z=3)[K]$	15000
$\gamma(z=3)$	1.3
Starting redshift	30

Gas



#### Dark Matter



#### Neutrinos



#### Rossi et al. 2014

Gas

y[Mpc/h]

y[Mpc/h]



Dark Matter

y[Mpc/h]

y[Mpc/h]



#### Neutrinos



#### End of lecture 1

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# Large scale structures with Lyman- $\alpha$ forests

Julián Bautista - Institute of Cosmology and Gravitation University of Portsmouth, United Kingdom







#### Questions from yesterday

- units of k:

$$z_i = \frac{\lambda_i}{\lambda_{\alpha}} - 1$$
  $\Delta v = c \frac{\Delta \lambda}{\lambda} \text{ [km/s]}$   $k \equiv \frac{2\pi}{\Delta v} \text{ [s/km]}$ 

- what quantity do you correlate in 1D power-spectrum?



$$\delta^q_F(\lambda_i) = \frac{F_i}{\bar{F}} - 1$$
Many of these per forest
One delta per pixel

$$\hat{\delta}^q(k_i) = \mathrm{FFT}[\delta^q(\lambda_i)]$$

$$P_F(k_i) = \langle \hat{\delta}_F^q(k_i) \overline{\hat{\delta}}_F^q(k_i) \rangle_q$$

Questions from yesterday

- The forests, do they trace the dark matter field or not?

Yes! And much better at low density regions than galaxies!



- What is the constraint on warm dark-matter from Yeche et al. 2017?

Early decoupled thermal relics:  $m_X \gtrsim 2.08 \text{ keV}$  (95% C.L.)

Non-resonantly produced right-handed neutrinos

 $m_s \gtrsim 10.2 \text{ keV} (95\% \text{ C.L.})$ 

# Questions from yesterday

- Do you fit a model to  $P_{1D}(k)$  in Yeche et al 2017?

You use the predicted  $P_{1D}(k)$  directly from the simulations and compare to the data!

Grid of simulations varying: cosmo parameters IGM parameters neutrino masses And interpolate between results to find best-fit

# Three-dimensional clustering measurements using BOSS forests

# Three-dimensional clustering measurements using BOSS forests

Survey of forests



Select galaxies and quasars from SDSS photometry Quasars are harder because they look like stars!

Image Credit: DSS Consortium, SDSS,

Select galaxies and quasars from SDSS photometry

Quasars are harder because they look like stars!



Divide targets

over plates

Select galaxies and quasars from SDSS photometry

Quasars are harder because they look like stars!










Beginner Professional 30 min / plate 3 min / fiber Repeat that for 2400 plates during 5 years! More than 1.3 million galaxies observed

Beginner 3 min / fiber Professional 30 min / plate

Repeat that for 2400 plates during 5 years! More than 1.3 million galaxies observed

More than 300 000 quasars observed



# First three-dimensional clustering measurement using 16k BOSS forests from 1st year



First evidence of large-scale correlations among different lines of sight, including redshift-space distortions

Slosar et al. 2011

# First three-dimensional clustering measurement using 16k BOSS forests from 1st year



First evidence of large-scale correlations among different lines of sight, including redshift-space distortions  $-0.24 < b_F < -0.16$  and  $0.44 < \beta_F < 1.20$  (95% confidence)

Slosar et al. 2011

# First three-dimensional clustering measurement using 16k BOSS forests from 1st year



# How to perform three-dimensional clustering and **BAO** measurements

Busca et al. 2013 Slosar et al. 2013 Kirkby et al. 2013 Font-Ribera et al. 2013 Delubac, JB, et al. 2014 JB et al. 2017 Du Mas des Bourboux et al. 2017

github.com/igmhub/picca



 $-\frac{2.4}{2.0}$ Quasar redshifts: visual inspection (Paris et al. 2012, 2014, 2016, 2017)

000

Nope [mm]

OCA

400

35

Quasar redshifts: visual inspection (Paris et al. 2012, 2014, 2016, 2017)

 $-\frac{3.2}{2.2}$ 

900

Xobs [mm]

OCL

400

35

50

Compute transmission fluctuations 

Quasar redshifts: visual inspection (Paris et al. 2012, 2014, 2016, 2017)

 $-\frac{2.2}{2.4}$   $-\frac{2$ 

000

Nope [mm]

064

400

35

5.0

Compute transmission fluctuations 

- Quasar redshifts: visual inspection (Paris et al. 2012, 2014, 2016, 2017)
- Compute transmission fluctuations
- Compute correlation function  $\xi(ec{r})$ •

n

400

35

600

N Xope [mm]

450

- Quasar redshifts: visual inspection (Paris et al. 2012, 2014, 2016, 2017)
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n

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r

35

- Quasar redshifts: visual inspection (Paris et al. 2012, 2014, 2016, 2017)
- Compute transmission fluctuations
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r

35

-500

Nope [mm]

024

400

Measure BAO scale 

### Computing fluctuations





$$\delta_q(\lambda) = \frac{f_q(\lambda)}{C_q(\lambda)\bar{F}(z)} - 1$$





 $\delta_q(\lambda) = \frac{f_q(\lambda)}{C_q(\lambda)\bar{F}(z)} - 1$ 

$$\hat{\xi}(r_{\perp}, r_{\parallel}) = \langle \delta_i \delta_j \rangle$$





$$\delta_q(\lambda) = \frac{f_q(\lambda)}{C_q(\lambda)\bar{F}(z)} - 1$$

$$\hat{\xi}(r_{\perp}, r_{\parallel}) = \langle \delta_i \delta_j \rangle$$





























 $r_{\perp}$  ( $h^{-1}$  Mpc)





 $r_{\perp}$  ( $h^{-1}$  Mpc)



 $r_{\perp}$  ( $h^{-1}$  Mpc)

### Measuring BAO Scale

Previously baofit (Kirkby++2013, Blomqvist++2015) Currently github.com/igmhub/picca



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Previously baofit (Kirkby++2013, Blomqvist++2015) Currently github.com/igmhub/picca

BAO scale 
$$\xi_{model}(\vec{r}, \alpha_{\parallel}, \alpha_{\perp}) = \xi_{cosmo}(\vec{r}, \alpha_{\parallel}, \alpha_{\perp}) + \xi_{broadband}(\vec{r})$$
  
 $r_{d} \sim 150 \text{ Mpc}$   
 $\Delta z$   
Distances  
 $\Delta \theta \propto \frac{r_d}{D_A(z)}$   
Hubble's law (in the past)  
 $\Delta z \propto \frac{r_d}{D_H(z)}$
#### Measuring BAO Scale

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$$\begin{array}{c} \xi_{\text{model}}(\vec{r}, \alpha_{\parallel}, \alpha_{\perp}) = \xi_{\text{cosmo}}(\vec{r}, \alpha_{\parallel}, \alpha_{\perp}) + \xi_{\text{broadband}}(\vec{r}) \\ \alpha_{\parallel} = \frac{D_{H}(\bar{z})/r_{d}}{[D_{H}(\bar{z})/r_{d}]_{\text{fid}}} \quad \text{and} \quad \alpha_{\perp} = \frac{D_{A}(\bar{z})/r_{d}}{[D_{A}(\bar{z})/r_{d}]_{\text{fid}}} \\ \Delta z \quad \text{Radial BAO} \quad \text{Transverse BAC} \\ Distances \\ \Delta \theta \propto \frac{r_{d}}{D_{A}(z)} \\ \text{Hubble's law (in the past)} \\ \Delta z \propto \frac{r_{d}}{D_{H}(z)} \end{array}$$

#### Measuring BAO Scale

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BAO scale  $\xi_{\text{model}}(\vec{r}, \alpha_{\parallel}, \alpha_{\perp}) = \xi_{\text{cosmo}}(\vec{r}, \alpha_{\parallel}, \alpha_{\perp}) + \xi_{\text{broadband}}(\vec{r})$  $r_d \sim 150 \text{ Mpc}$  $\alpha_{\parallel} = \frac{D_H(\bar{z})/r_d}{[D_H(\bar{z})/r_d]_{\text{fd}}} \qquad \text{and} \qquad \alpha_{\perp} = \frac{D_A(\bar{z})/r_d}{[D_A(\bar{z})/r_d]_{\text{fd}}}$  $\Delta z$ Radial BAO Transverse BAO  $r^2 \xi_{
m model}$ Distances  $\Delta heta$  $\Delta \theta \propto \frac{r_d}{D_A(z)}$ Hubble's law (in the past)  $\Delta z \propto \frac{r_d}{D_H(z)}$ ()  $r_{\perp}$ 

#### Measuring BAO Scale



### Expansion rate as measured with BAO





Bautista et al. 2017

### Expansion rate as measured with BAO





Bautista et al. 2017

There is bonus cosmological information in this sample...

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There are at least 3 bonus tracers in that movie... which ones?











# Damped Lyman-alpha Systems (DLAs) as tracers of dark-matter field



About 20% of forests contain DLAs

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Font-Ribera et al. 2012, Pérez-Ràfols et al. 2018

# Damped Lyman-alpha Systems (DLAs) as tracers of dark-matter field



About 20% of forests contain DLAs



Font-Ribera et al. 2012, Pérez-Ràfols et al. 2018

 $b_{
m DLA} = 2.00 \pm 0.19$  Host halo mass ~  $4 \cdot 10^{11} \, h^{-1} {
m M}_{\odot}$ 

There are two left...











Provides complementary BAO information with the same sample! (Font-Ribera et al. 2013, Du-Mas-des-Bourboux et al. 2017)



No significant correlation was found between the auto and cross measurements!





The combined measurement has 2.3 sigma difference with Planck prediction!

#### BAO versus Supernovae



#### BAO

Beutler et al. 2011 Ross et al. 2015 Alam et al. 2017 Bautista et al. 2017 Du-Mas-Des-Bourboux et al. 2017

**Supernovae la** Betoule et al. 2014

#### **BAO** versus Supernovae







#### **BAO** versus Supernovae



#### Last tracer? This one is harder...



#### Forest of Metals : CIV, SIV, MgII, etc







#### Forest of Metals : CIV, SIV, MgII, etc CIV $z_{QSO} > 2.1$ (1550 Å SilV (1400 Å) ANAMANAN NALIY 100 $0.00 < |\mu| < 1.00$ 1.0 $C_{\rm q}(\lambda)\overline{F}(z)$ (CIV) 90 $f_{\lambda} \; [10^{-19} { m W} \, { m m}^{-2} \, { m nm}^{-1}]$ $C_{\rm q}(\lambda)\overline{F}(z)$ (SiIV) 80 0.5 $r^{2}\xi(r,\mu) [h^{-2}Mpc^{2}]$ 70 0.0 60 50 -0.5CIV (in CIV) 40 combined 30 3800 -1.03900 4000 4100 4200 4300 4400 4500 4600 20 40 60 100 180 80 120 140 160 $\lambda$ [Å] $r [h^{-1} \mathrm{Mpc}]$



 $b_{\rm CIV}(z_{\rm eff}=2.00)=-0.0144\pm0.0010$ 

#### How about metals in the Lyman-alpha forest?

#### Metals in the Lyman-alpha forest

#### Metals in the Lyman-alpha forest










Impact of CIV in the Lyman-alpha forest clustering is negligible

Radial 3D correlations



Impact of CIV in the Lyman-alpha forest clustering is negligible

That's not all with metals...

Same line-of-sight (or 1D) correlations



Same line-of-sight (or 1D) correlations

Different line-of-sight (or 3D) radial correlations











We marginalize over metal correlations (2 parameters per transition)



We marginalize over metal correlations (2 parameters per transition) Impact on BAO: more robust + increase of errors by 25%

#### Lyman-alpha Auto-Correlation function



 $r_{\perp}$  ( $h^{-1}$  Mpc)

Bautista et al. 2017



$$\delta_{\alpha}(\boldsymbol{x}) = b_{\delta}\delta(\boldsymbol{x})$$



$$\delta_{\alpha}(\boldsymbol{x}) = b_{\delta}\delta(\boldsymbol{x}) + b_{\Gamma}\delta_{\Gamma}(\boldsymbol{x}),$$
$$\delta_{\Gamma}(\boldsymbol{x}) = \Gamma(\boldsymbol{x})/\bar{\Gamma} - 1$$



# List of tests on systematic errors

Astrophysical systematics

- contamination by metals: Si, C
- contamination by DLAs, or BALs
- contamination by galactic absorption
- effect of UV background fluctuations
- effect of continuum fitting

Instrumental systematics

- impact of flux calibration
- impact of sky residuals
- impact of fiber cross-talk
- impact of extraction

All tests were performed on data and mock catalogs

# Mock catalogs for BAO with Lyman-alpha forests

Hydro-sims are not feasible: we need **hundreds** of realizations of **large** volumes while resolving **small**-scales

We use log-normal mock forests generated though  $P_F(k,\mu) = P_0^2(1 + \beta \mu^2)^2 P_{\text{lin}}(k)D(k,\mu)$ (Font-Ribera et al. 2012, Bautista et al. 2015)

Run quick dark-matter only N-body and "paint" forests using

$$T = T_0 \left(\frac{\rho_b}{\bar{\rho}_b}\right)^{\gamma} \qquad X \approx \frac{\alpha_{\rm rec} n_e}{\Gamma}$$

Very useful for semianalytical simulations!

These include quasar-forest correlations (LeGoff et al. 2011)

# Mock catalogs for BAO with Lyman-alpha forests



- Resolution, binning
- High column density systems
- Metals
- Continuum
- Noise
- Sky subtraction residuals
- Observational errors

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Bautista et al. (2015)

## The future

# Future

- DESI
- HETDEX
- PFS
- 4MOST
- Euclid
- WFIRST

Dark Energy Spectroscopic Survey will start operations in 2020

2.5 meters -> 4.0 meters 7500 deg<sup>2</sup> -> 14000 deg<sup>2</sup> 1000 fibers -> 5000 fibers fibers plugged by human -> fibers plugged by robot similar final spectral S/N

#### Fiber positioner





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## of "focal-plane"
# DESI

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### DESI Spectroscopic Survey operations in 2020

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#### Conclusions

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- The forest traces the "few" neutral hydrogen atoms at high redshift
- The neutral hydrogen traces the dark matter field even at low densities and it is mostly a linear tracer
- The access to small-scale clustering yields very interesting constraints on neutrino masses
- With a large survey of forests, BAO can be measured at higher redshift than galaxies, constraining dark-energy models
- DESI will start next year and increase volume and number of quasars
- Dark Energy and Neutrinos: here we come!