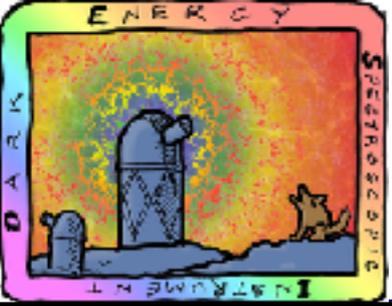


Cosmology with the Lyman- α forest: challenges and opportunities

Andreu Font-Ribera

STFC Ernest Rutherford Fellow at University College London



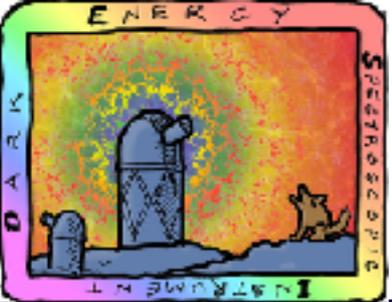
Large scale structure



The distribution of matter in the Universe tells us about:

- Accelerated expansion of the Universe / dark energy
- Tests of general relativity on cosmological scales
- Initial conditions of the Universe / inflation
- Particle physical properties of dark matter
- Mass and number of neutrino species

However, most of the matter in the Universe is in the form of dark matter and we need indirect tracers to study it

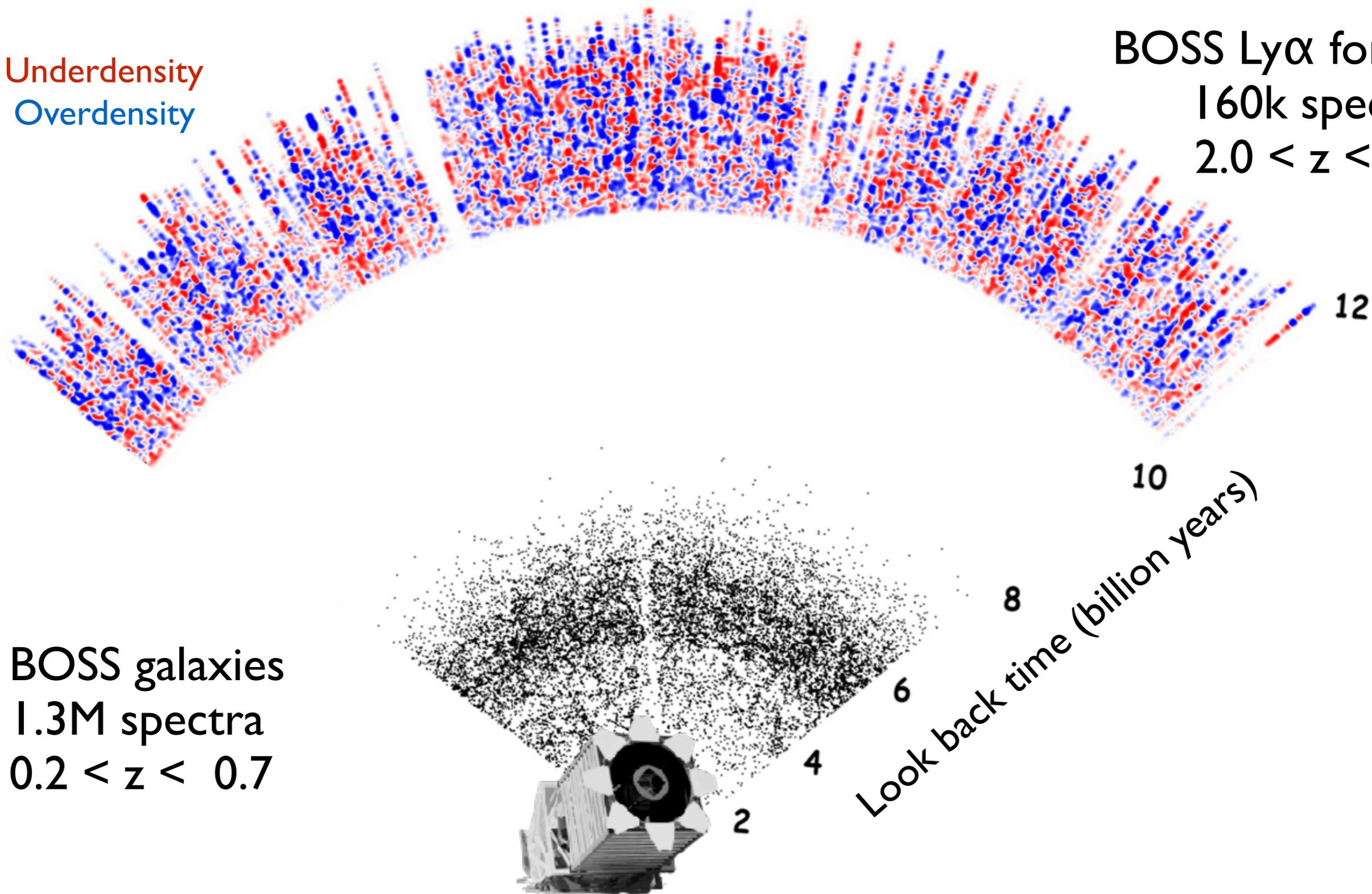


Redshift Surveys



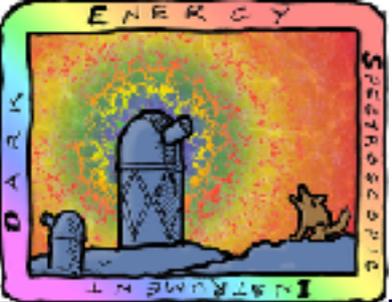
Underdensity
Overdensity

BOSS Ly α forest
160k spectra
 $2.0 < z < 3.5$



BOSS galaxies
1.3M spectra
 $0.2 < z < 0.7$

Look back time (billion years)



Outline



- **Baryon Acoustic Oscillations (BAO)**
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Baryon Acoustic Oscillations



To study the expansion we want to measure the distance to different redshifts

Standard candle (Supernovae)

known luminosity

+

measure flux



distance

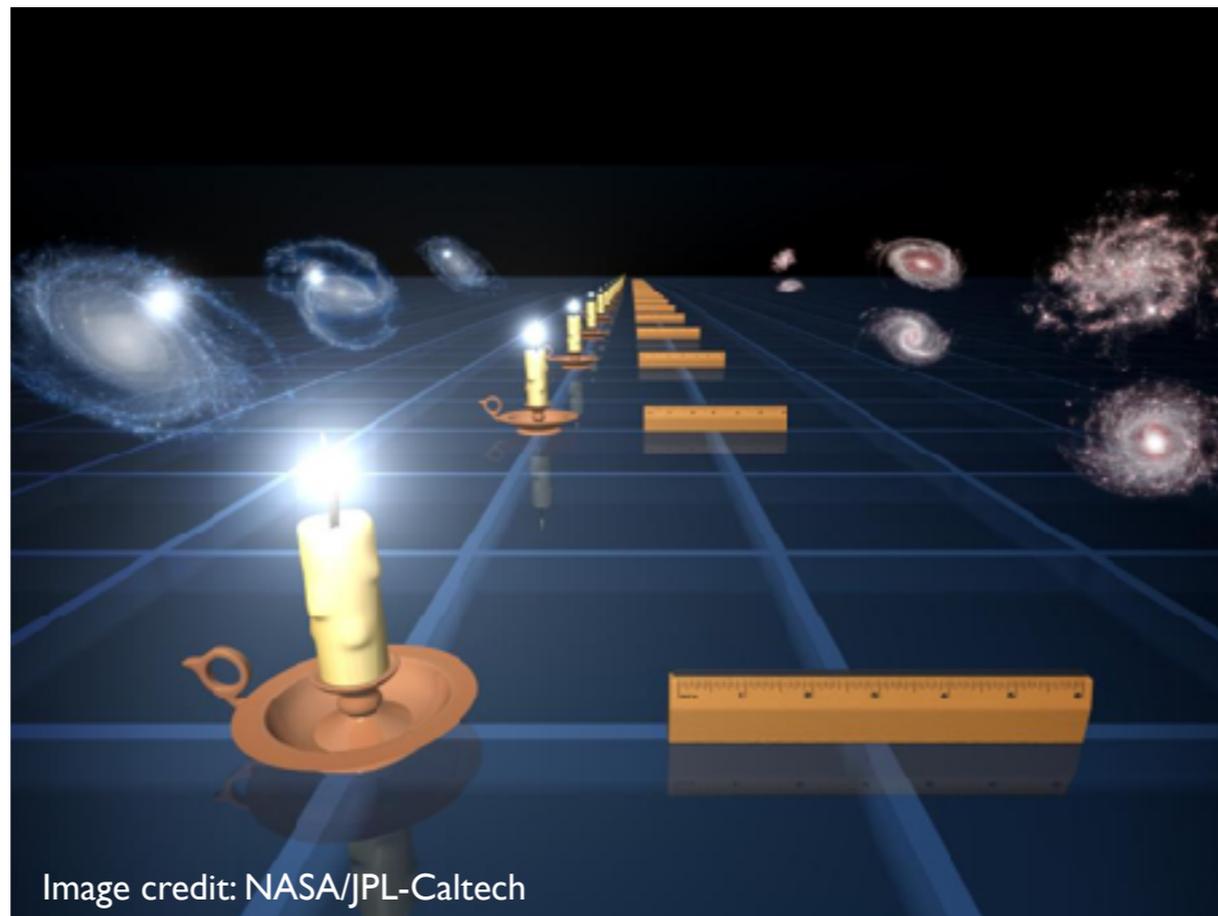


Image credit: NASA/JPL-Caltech

Standard ruler (BAO)

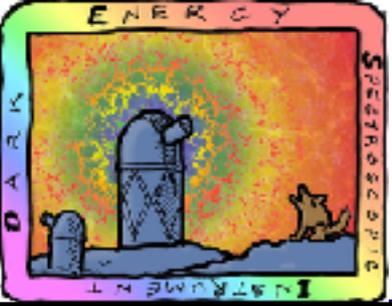
known size

+

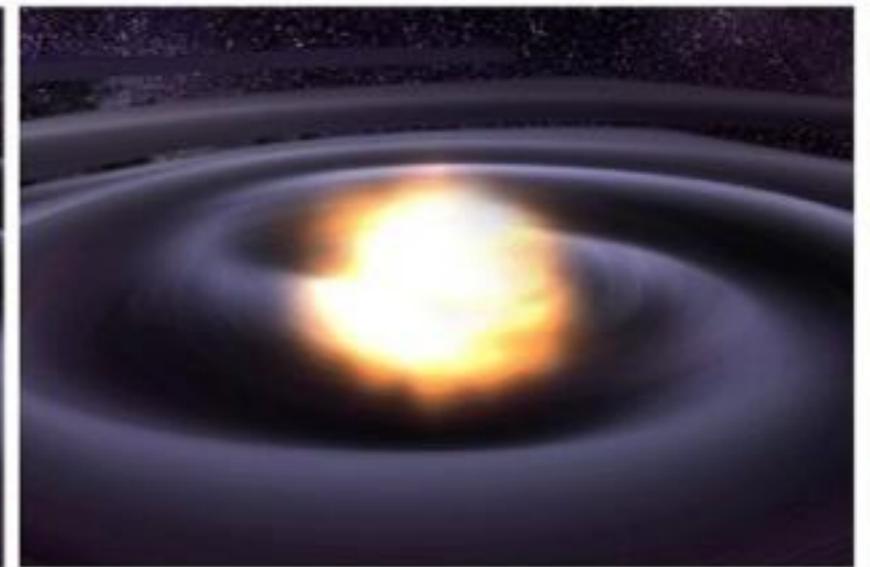
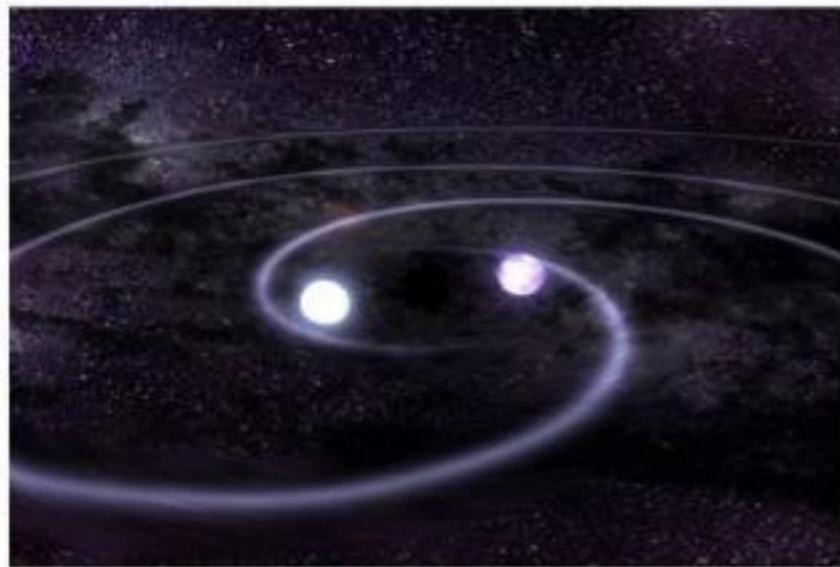
measure apparent size



distance



Baryon Acoustic Oscillations

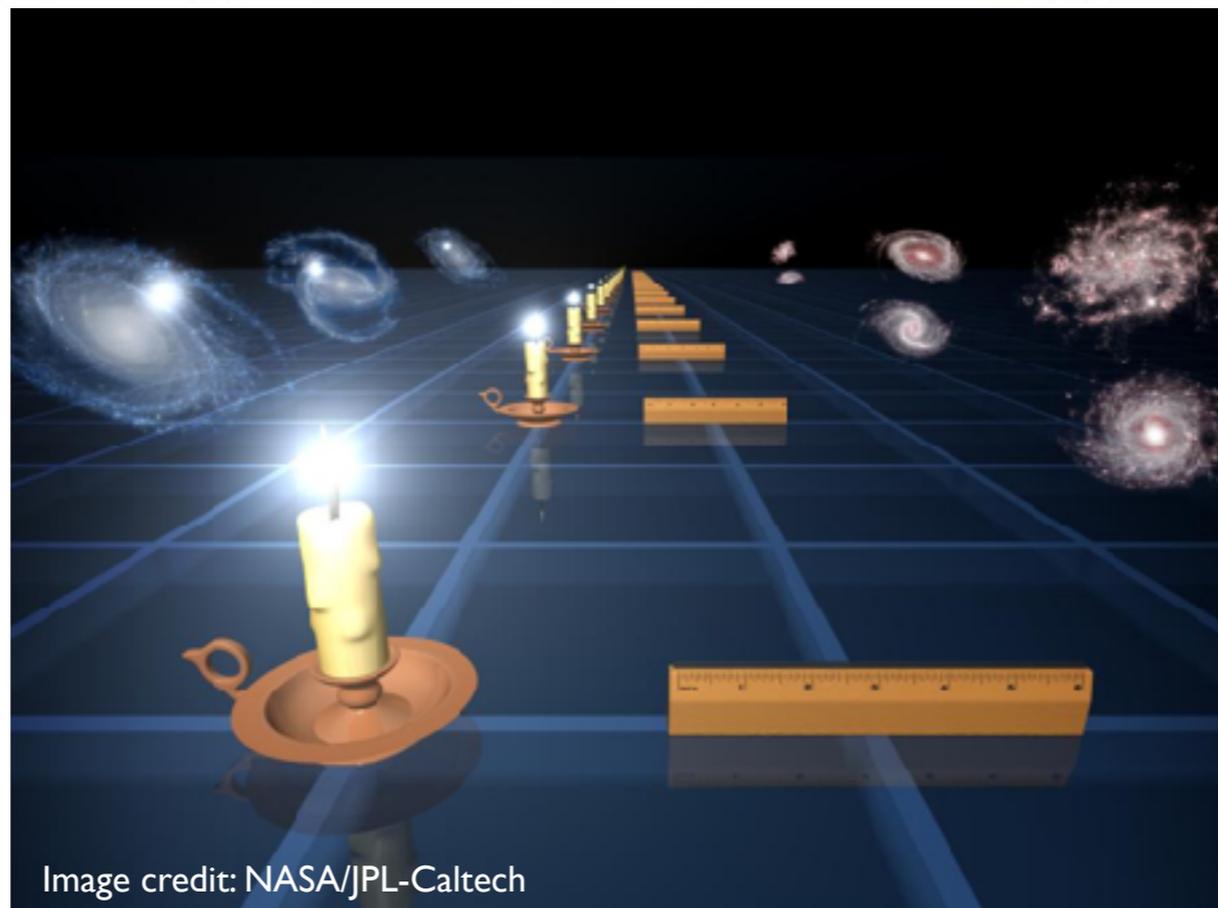


Standard candle (Supernovae)

known luminosity
+
measure flux



distance

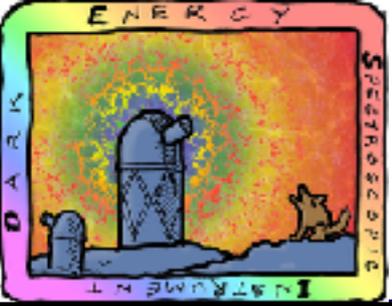


Standard ruler (BAO)

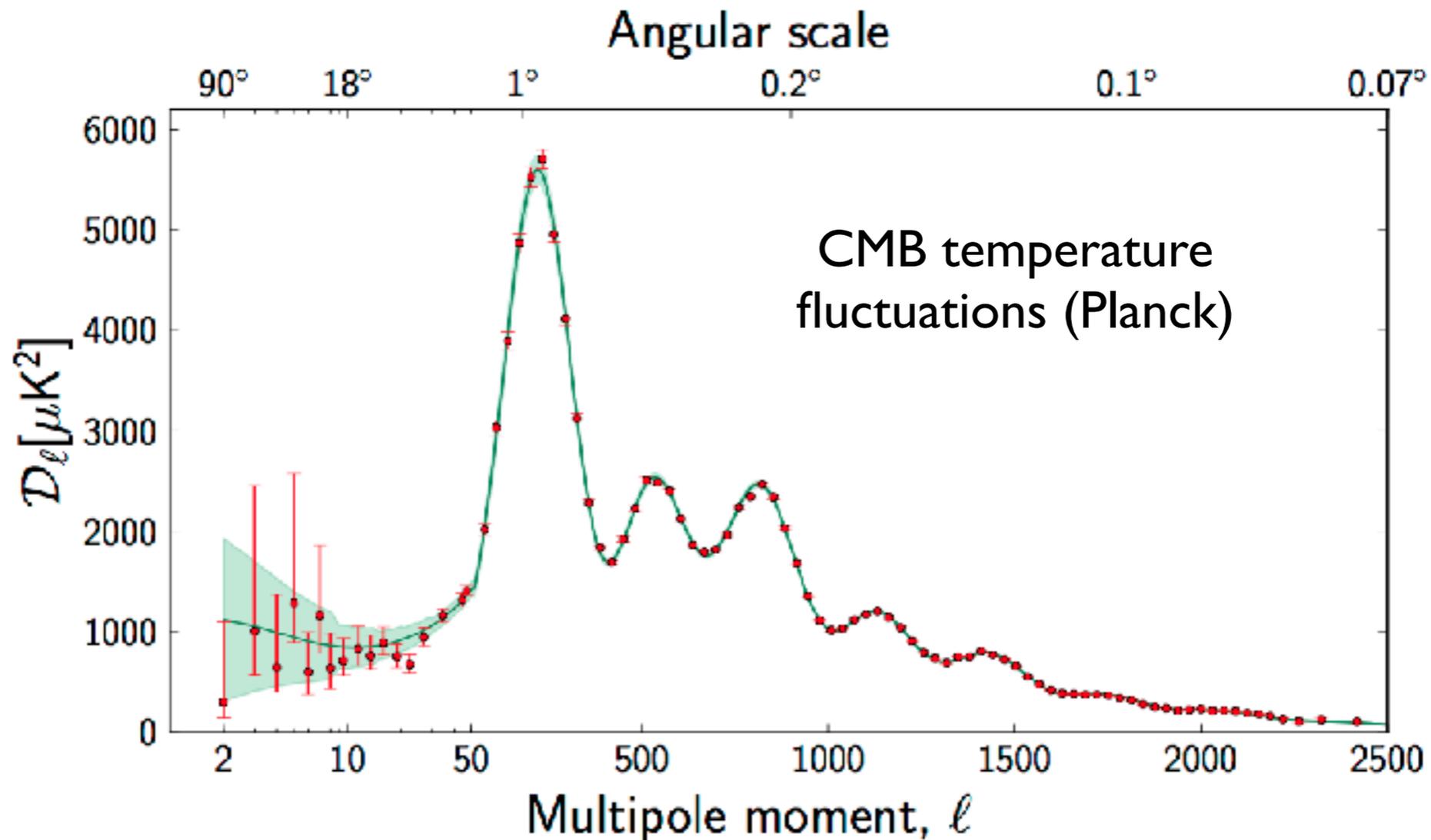
known size
+
measure apparent size



distance

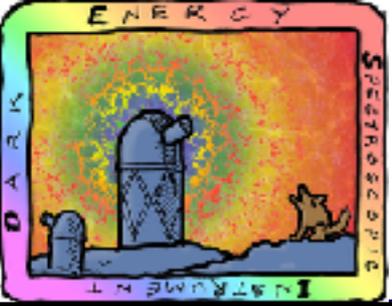


Baryon Acoustic Oscillations



$$r_d = \int_{z_d}^{\infty} \frac{c_s(z)}{H(z)} dz \quad c_s(z) = 3^{-1/2} c \left[1 + \frac{3}{4} \rho_b(z) / \rho_\gamma(z) \right]^{-1/2}$$

Sound horizon at recombination (from Planck): $r_d = 147.6 \pm 0.3$ Mpc



Baryon Acoustic Oscillations



We measure BAO scale in the transverse direction in BOSS : $\Delta\theta_{BAO}$

We measure BAO scale along the line of sight in BOSS : Δv_{BAO}

Sound horizon at recombination (from Planck): $r_d = 147.6 \pm 0.3$ Mpc

$$\Delta\theta_{BAO} = \frac{r_d}{1+z} \frac{1}{D_A(z)} \quad \Delta v_{BAO} = \frac{r_d}{1+z} H(z)$$

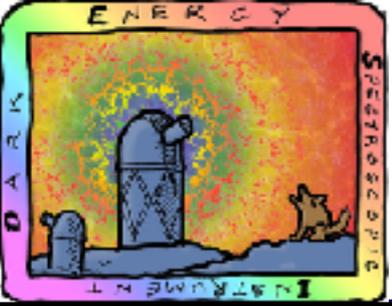
We learn about the expansion!



Outline



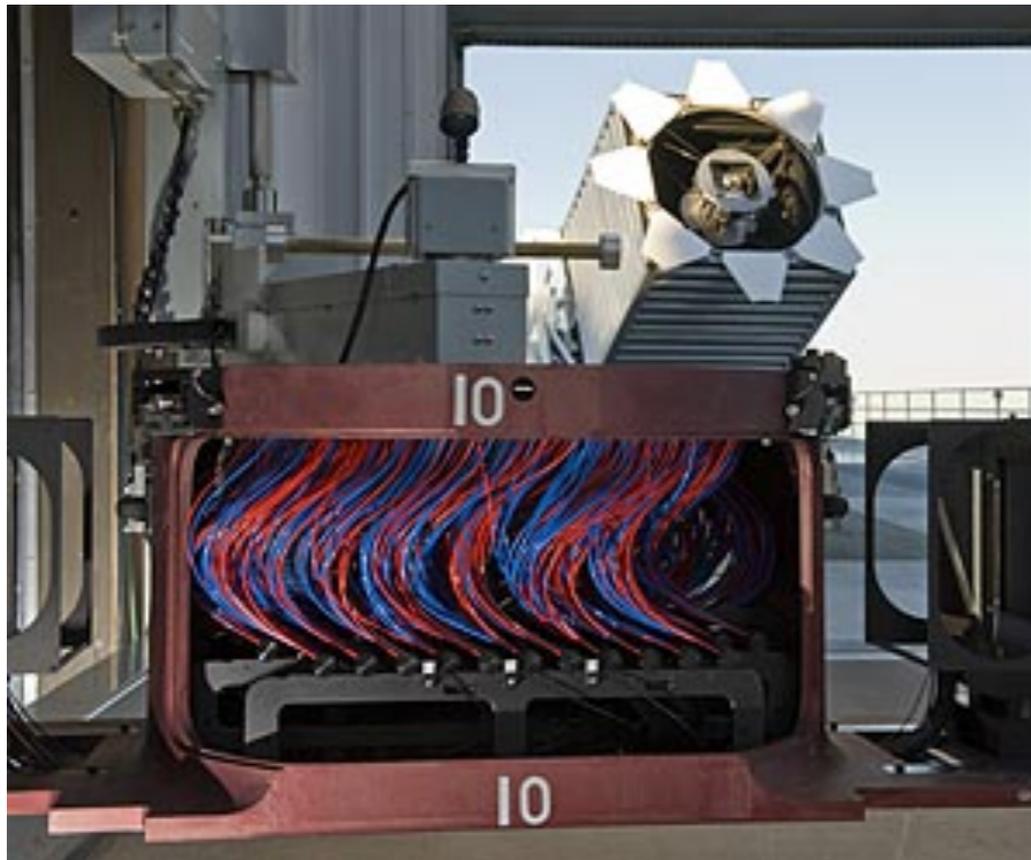
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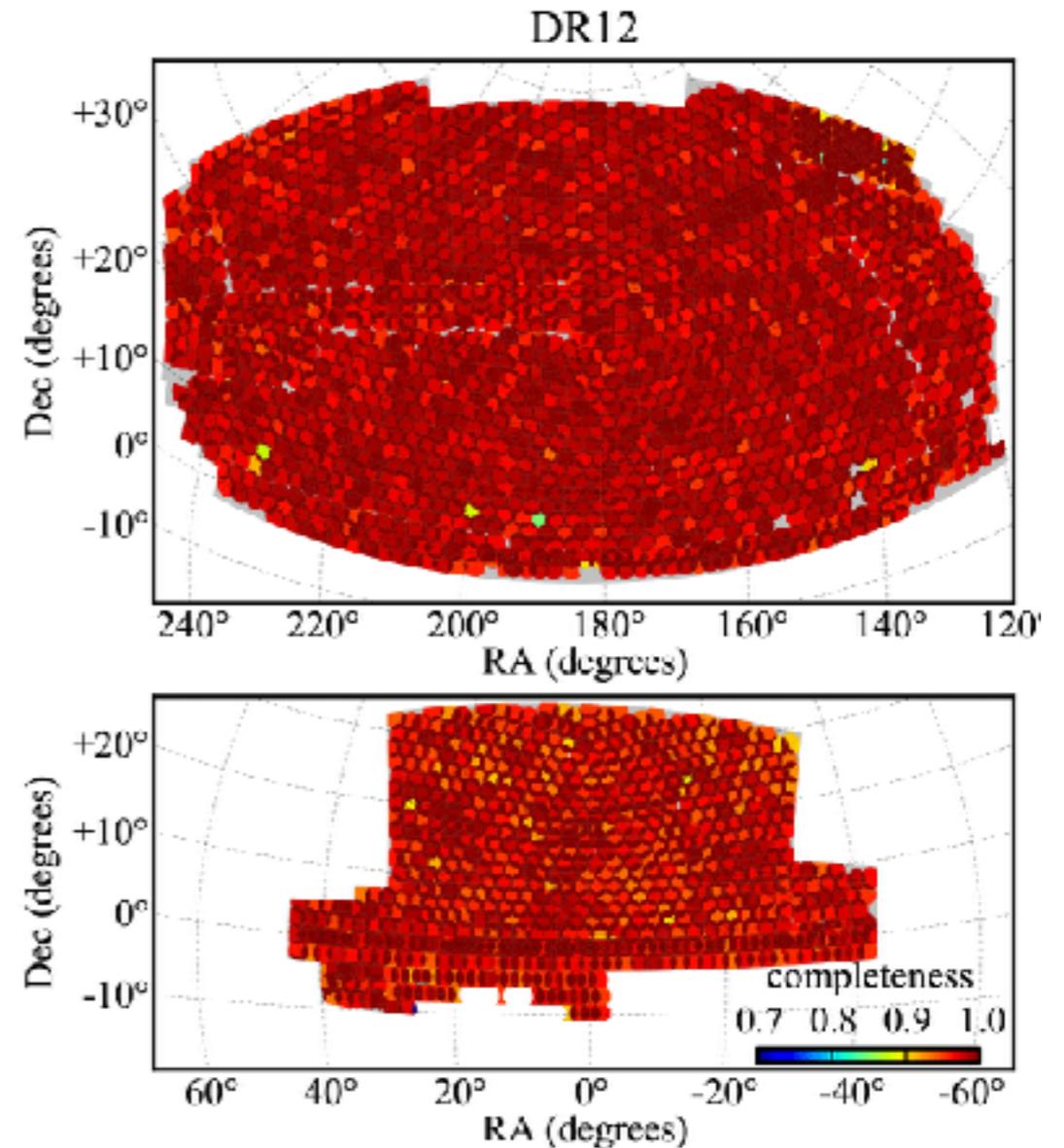
BOSS



SDSS Telescope (2.5m)
Apache Point Observatory
(Cloudcroft, New Mexico)



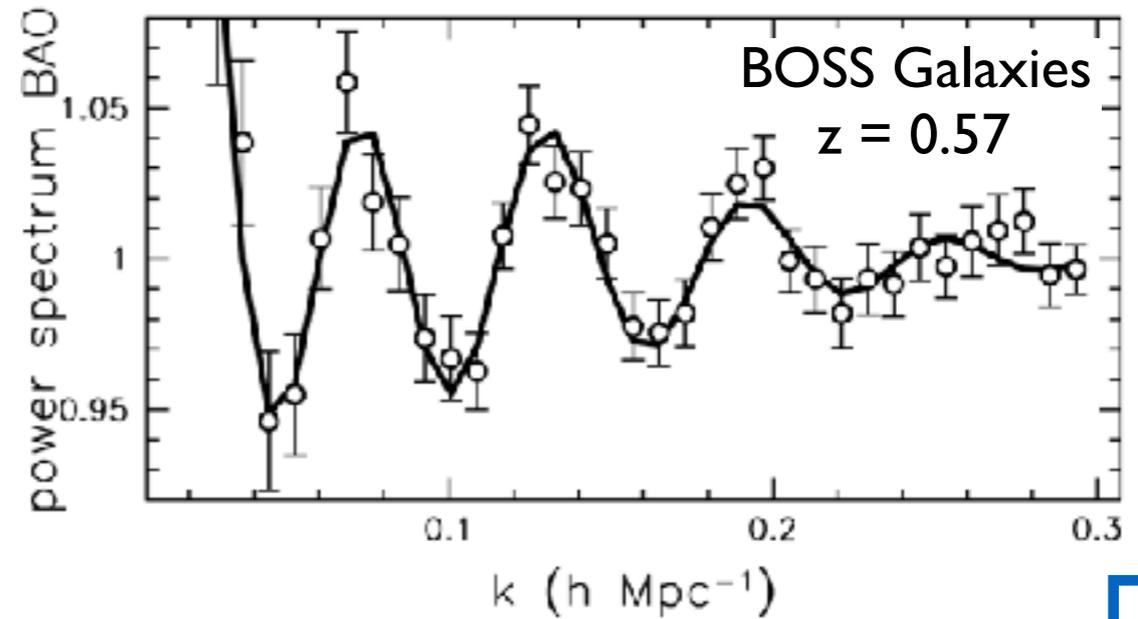
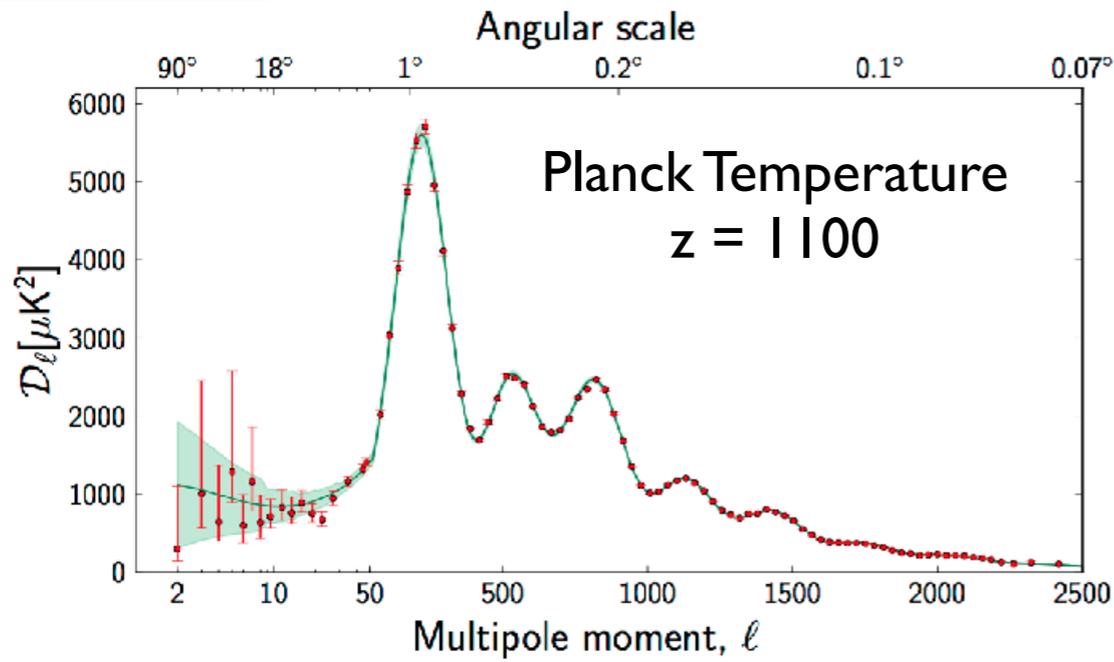
2 optical spectrographs
Mid resolution ($R \sim 2000$)
1000 spectra at a time



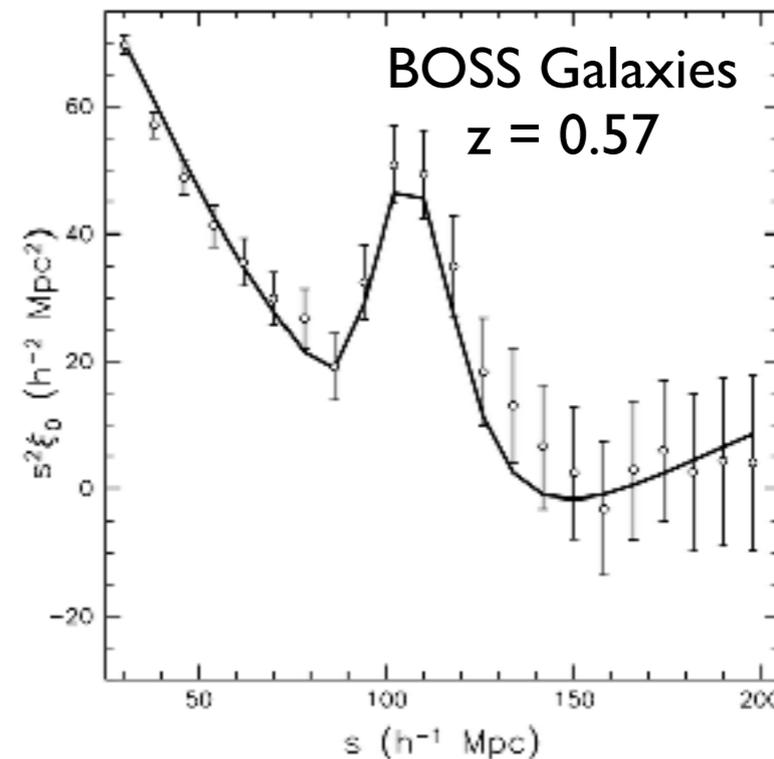
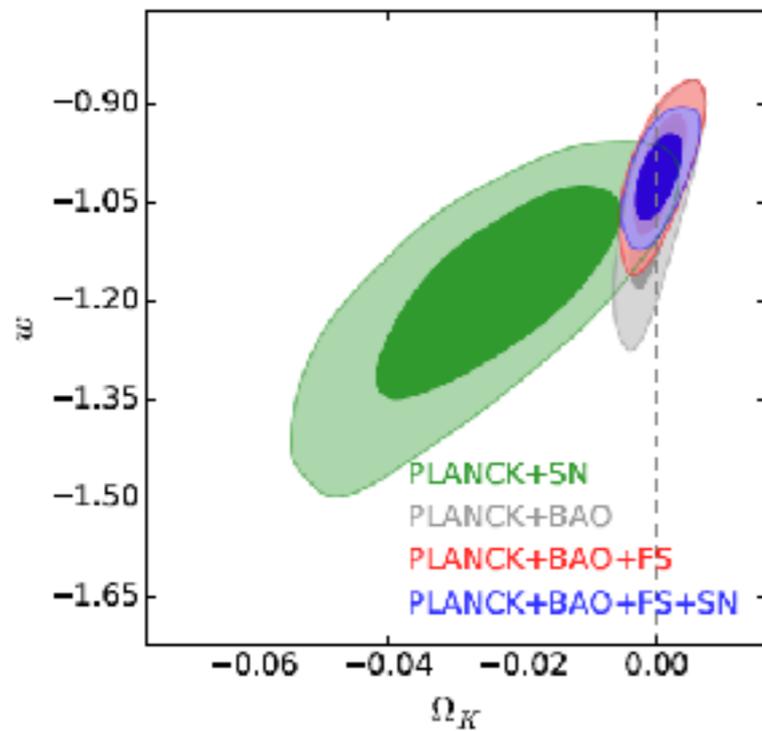
10,000 sq. deg. (1/4 sky)
1.3M galaxies ($0.2 < z < 0.7$)
160k quasar ($2.1 < z < 3.5$)



Baryon Acoustic Oscillations



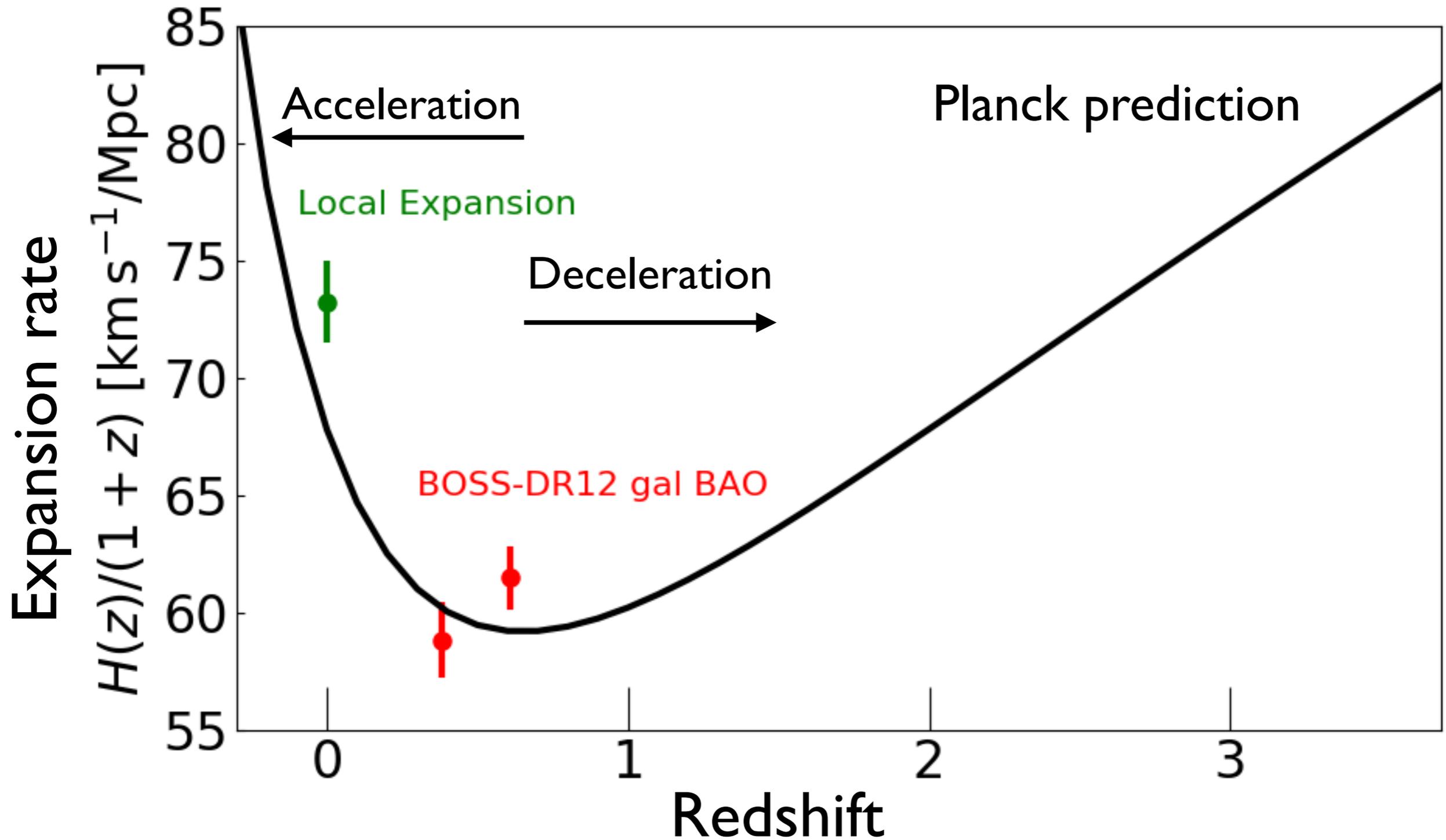
Oscillations clearly seen in CMB, but also in clustering of galaxies

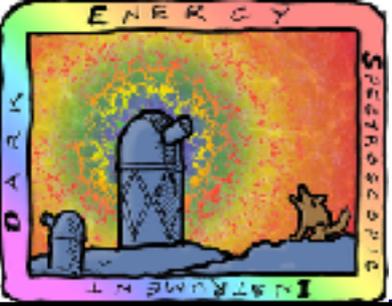


Fourier transform



BOSS

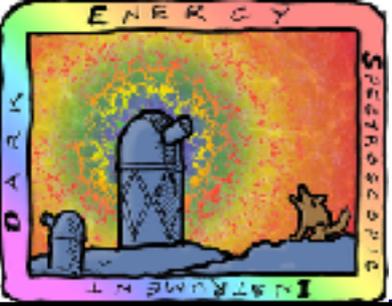




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The Lyman- α forest

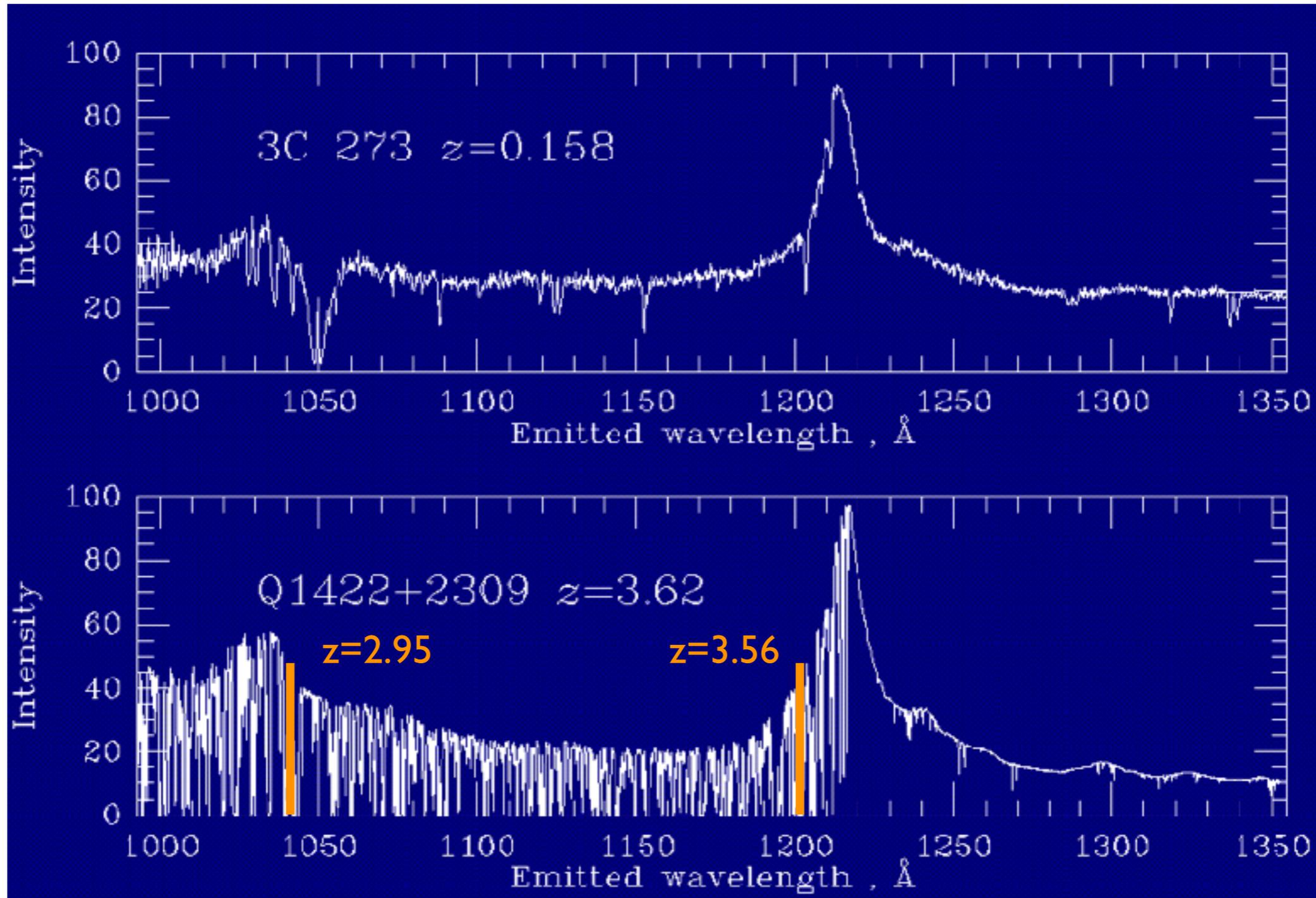
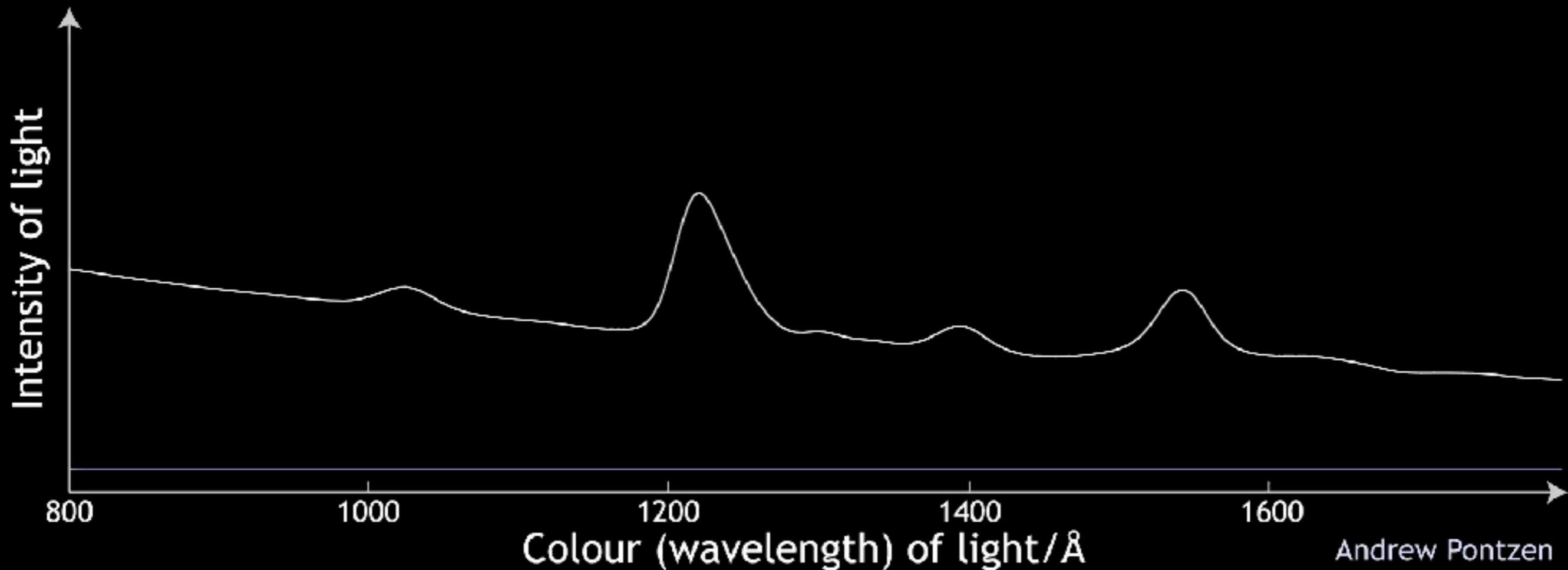
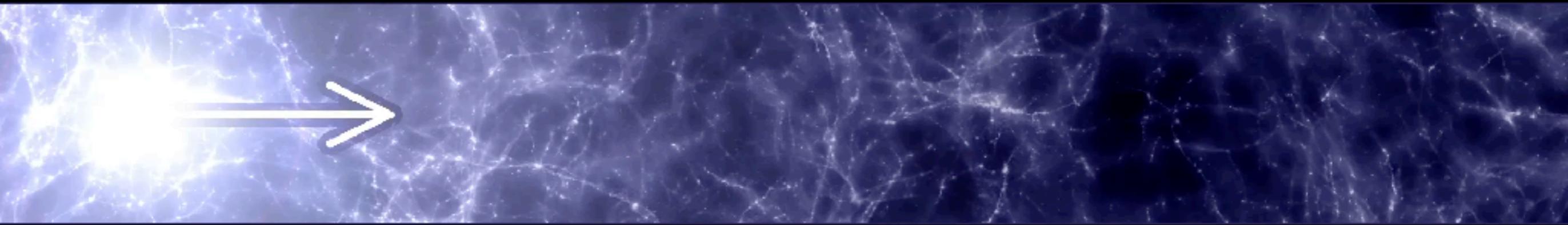


Figure from William C. Keel

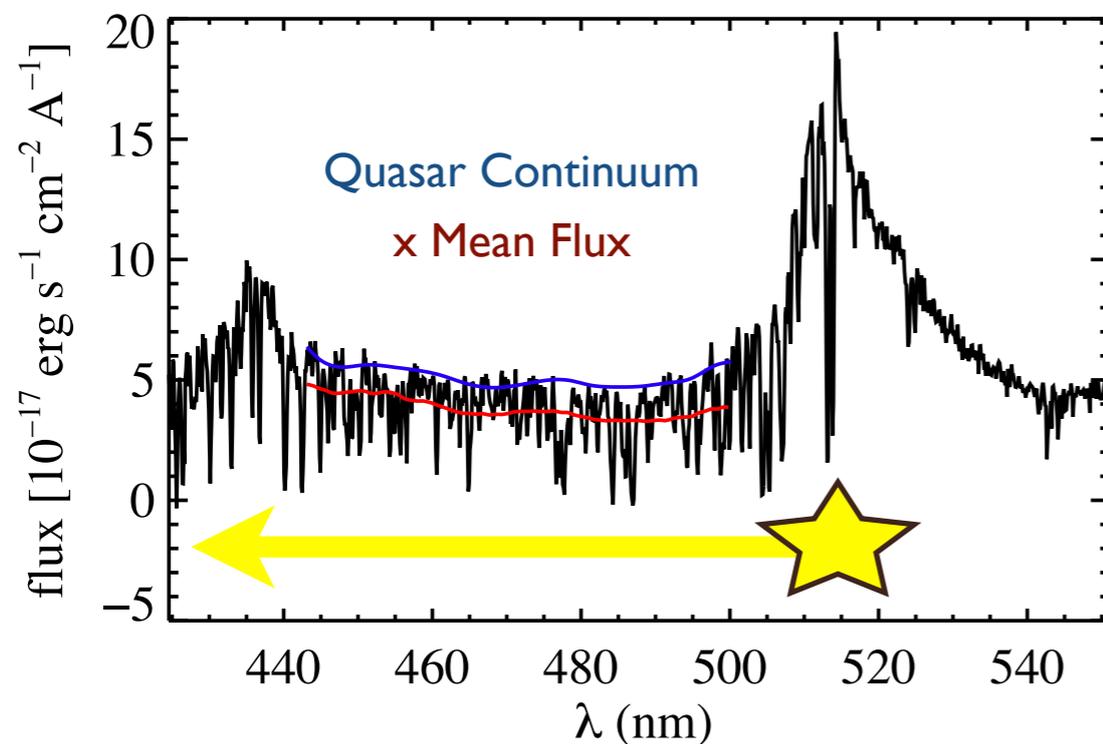


The Lyman- α forest





The Lyman- α forest



Observed flux

Transmitted fraction

$$f_q(\lambda) = C_q(\lambda) F_q(\lambda)$$

Quasar continuum

Observed wavelength

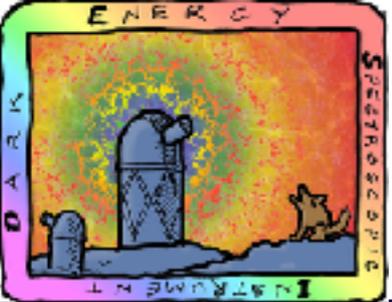
Absorption redshift

$$\lambda = \lambda_\alpha (1 + z)$$

LyaF wavelength (121.6 nm)

$$\delta_F(\mathbf{x}) = \frac{F(\mathbf{x}) - \bar{F}}{\bar{F}}$$

Flux fluctuations in pixels trace the density along the line of sight to the quasar



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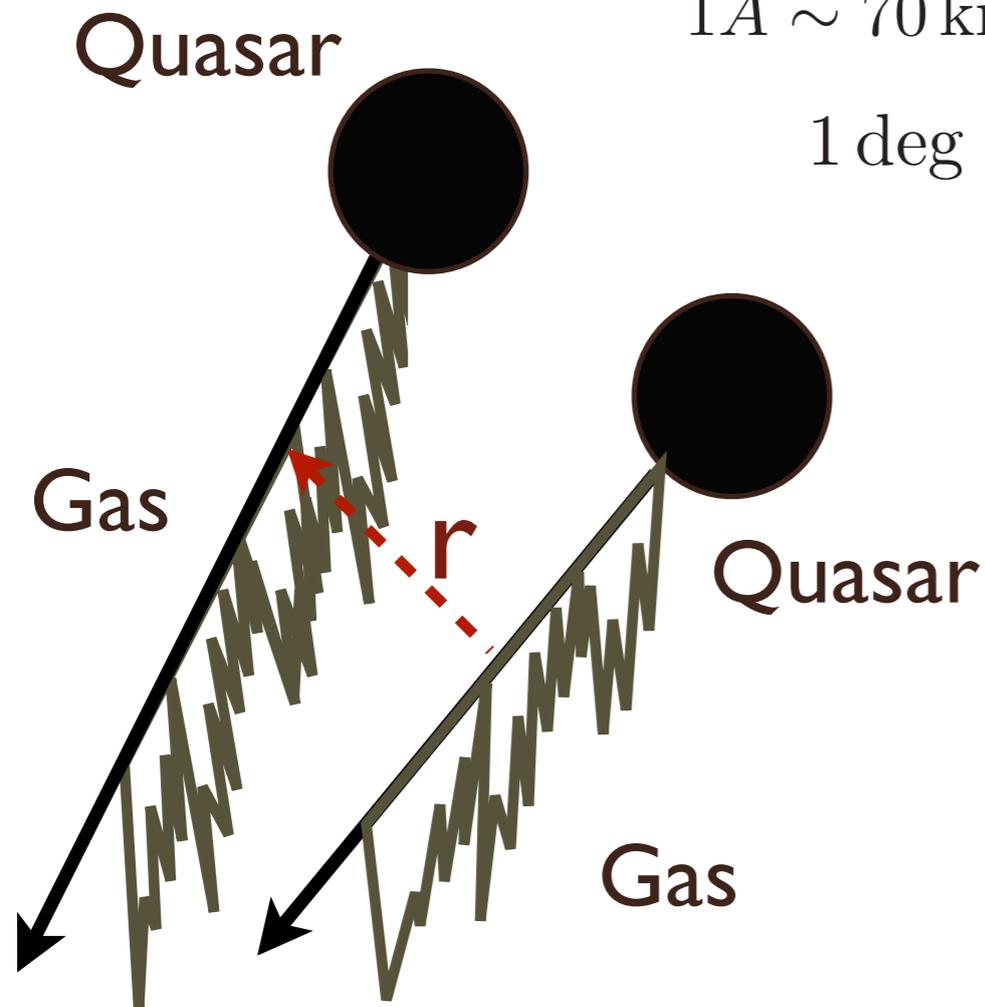
BOSS Lyman- α BAO



Two independent ways of measuring the BAO scale

$$1\text{\AA} \sim 70 \text{ km s}^{-1} \sim 0.7 h^{-1} \text{ Mpc}$$

$$1 \text{ deg} \sim 70 h^{-1} \text{ Mpc}$$



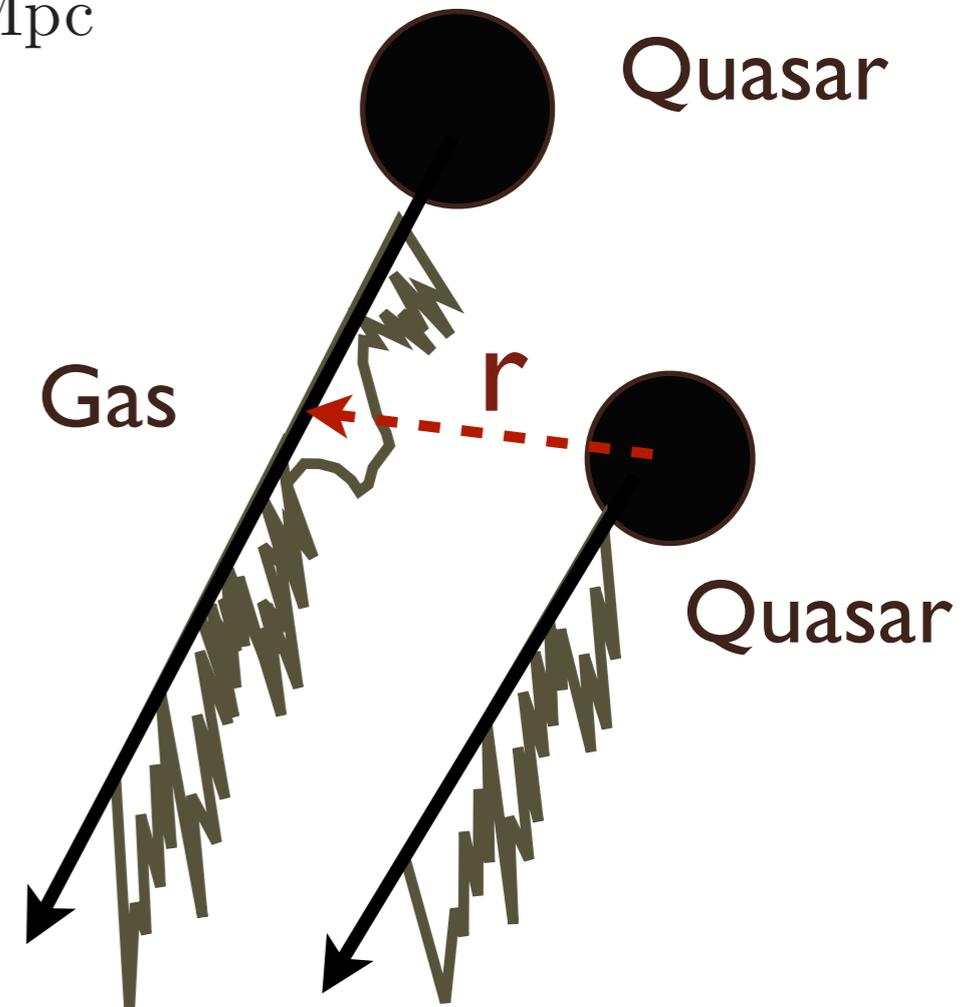
Ly α auto-correlation

Delubac et al. (2015)

Bautista et al. (2017)

— DR11 —

— DR12 —



Ly α -quasar cross-correlation

Font-Ribera et al. (2014)

du Mas des Bourboux (2017)

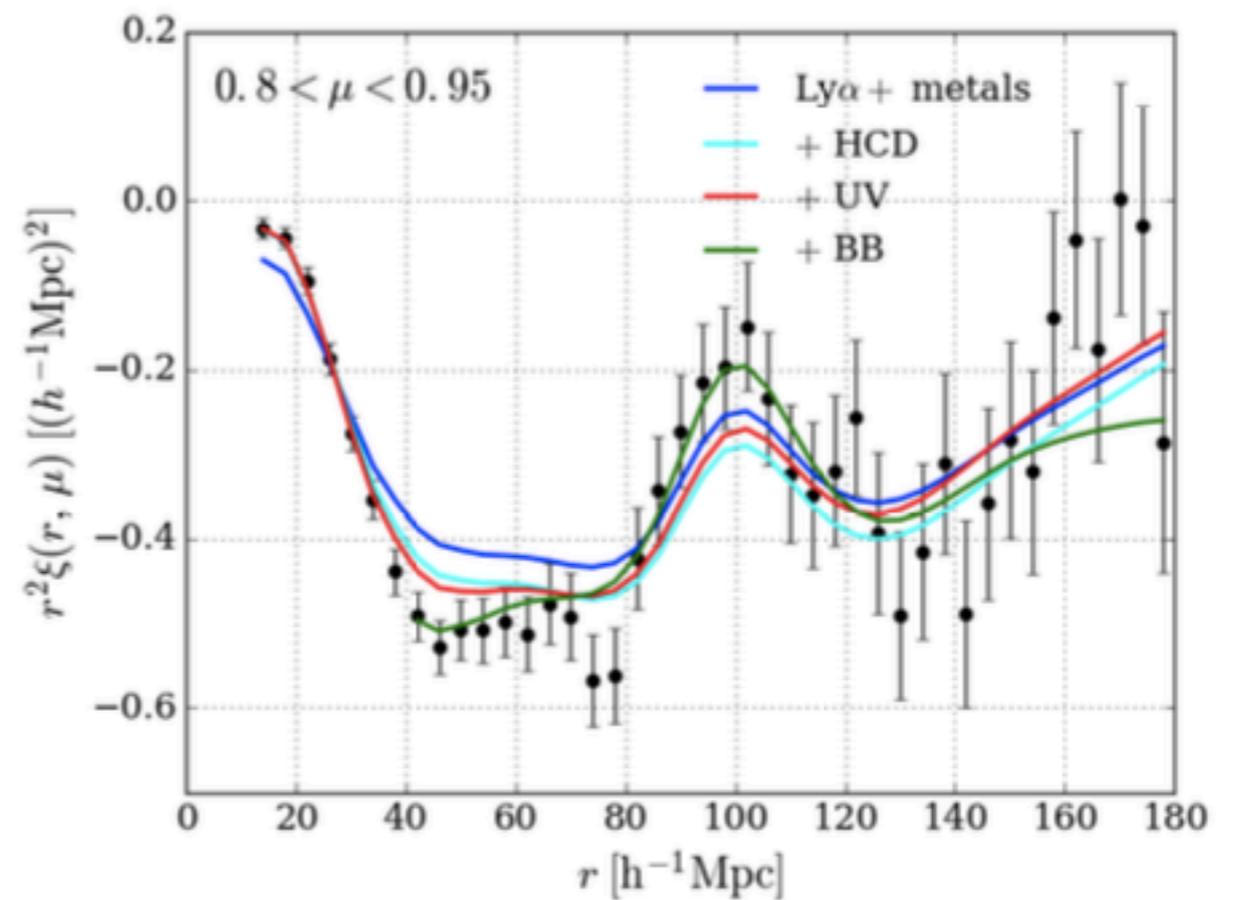
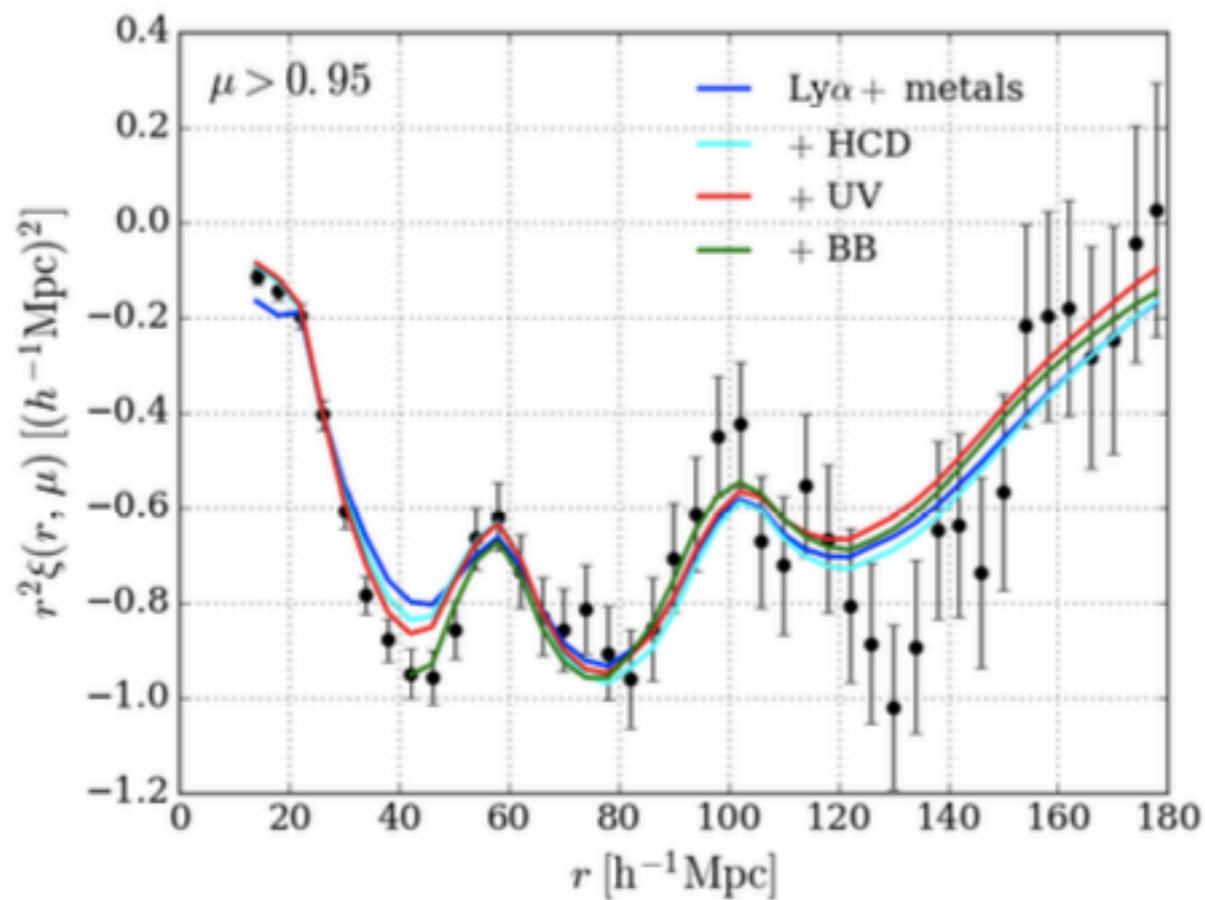


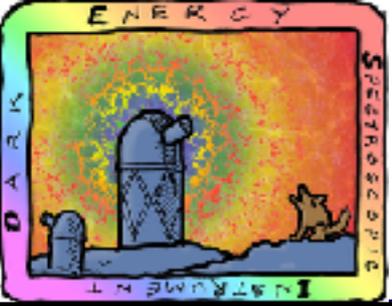
Ly α auto-BAO



Julian Bautista
(Moved from Utah
to Portsmouth)

Bautista et al (2017)
BAO from DR12 Ly α
auto-correlation



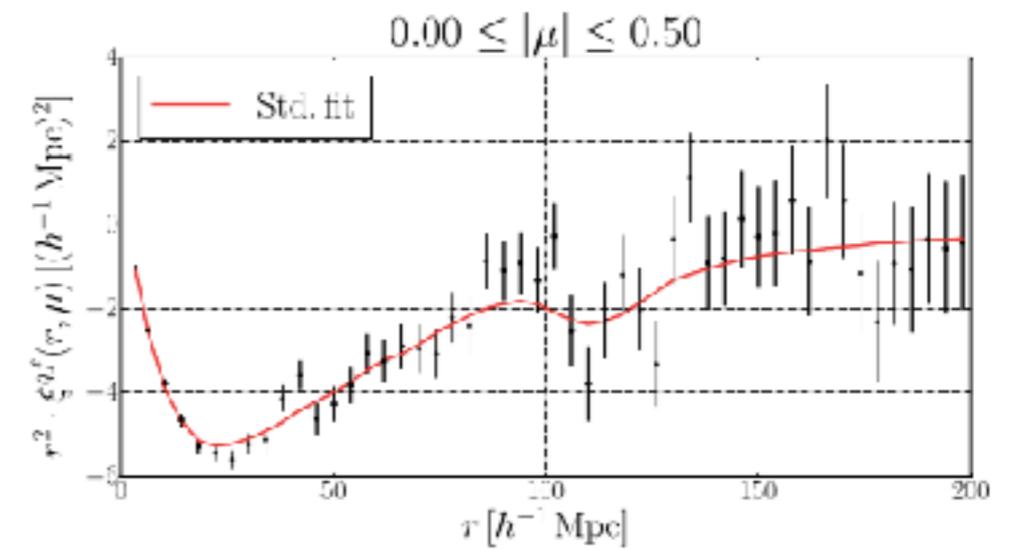
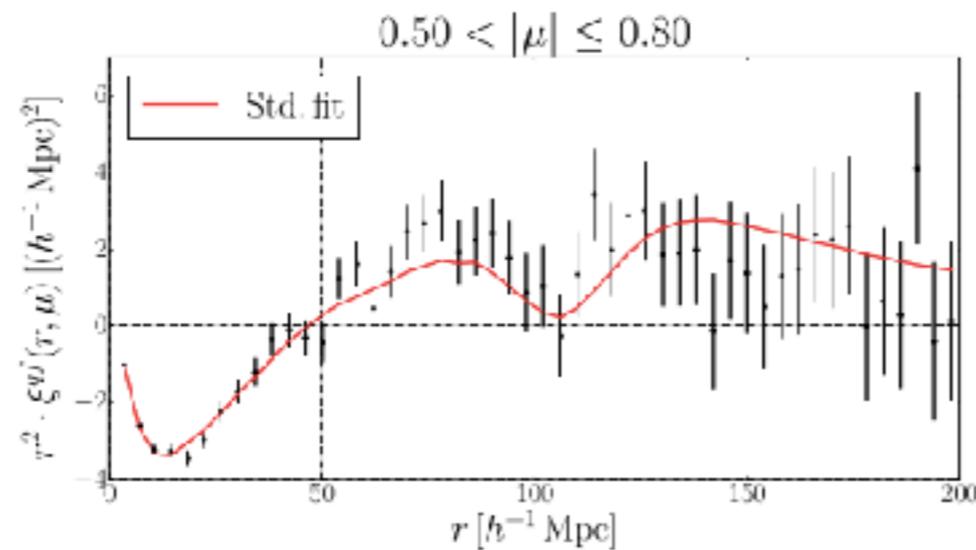
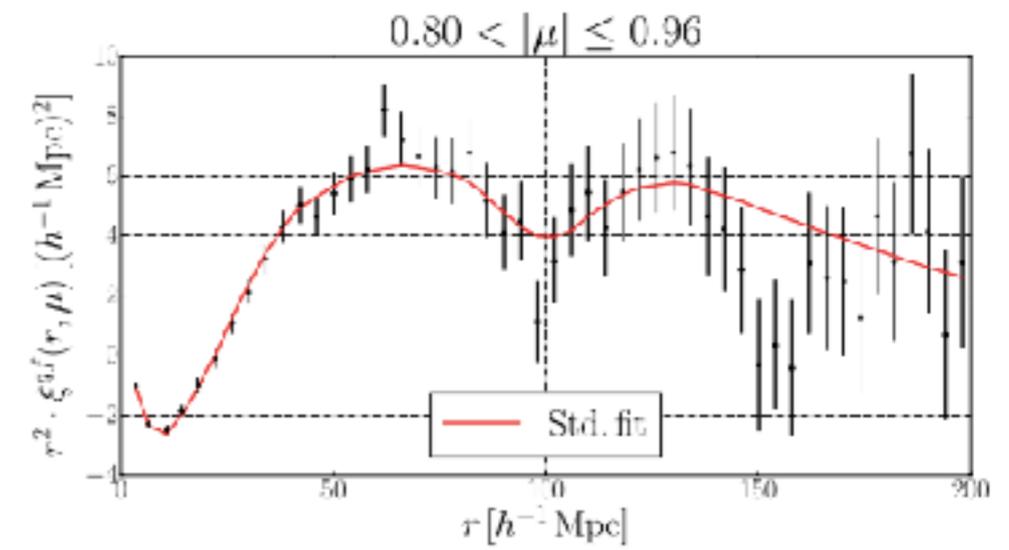
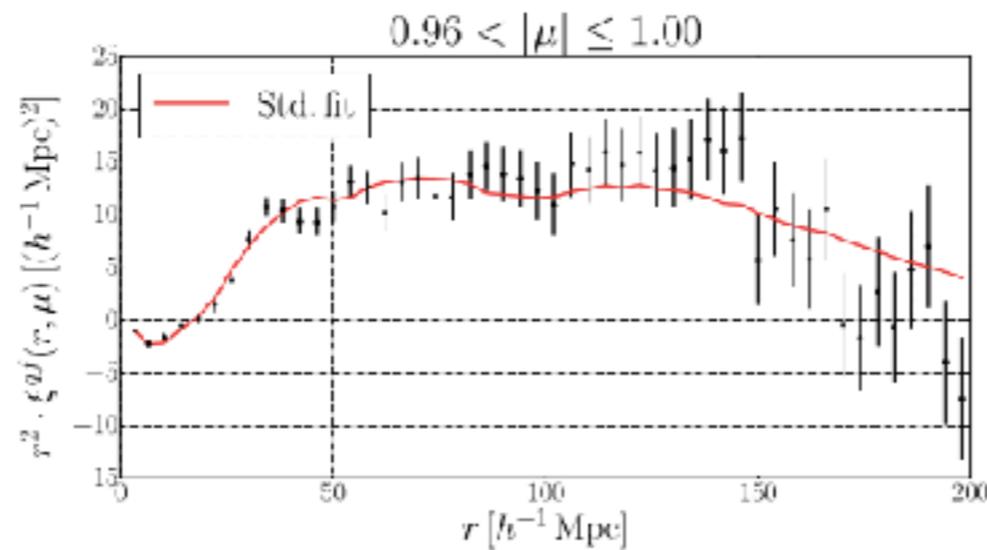


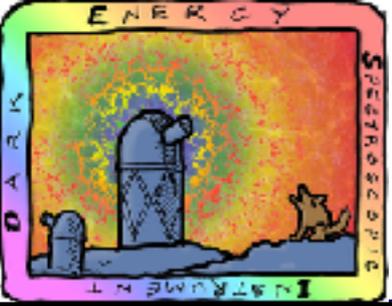
QSO-Lya cross-BAO



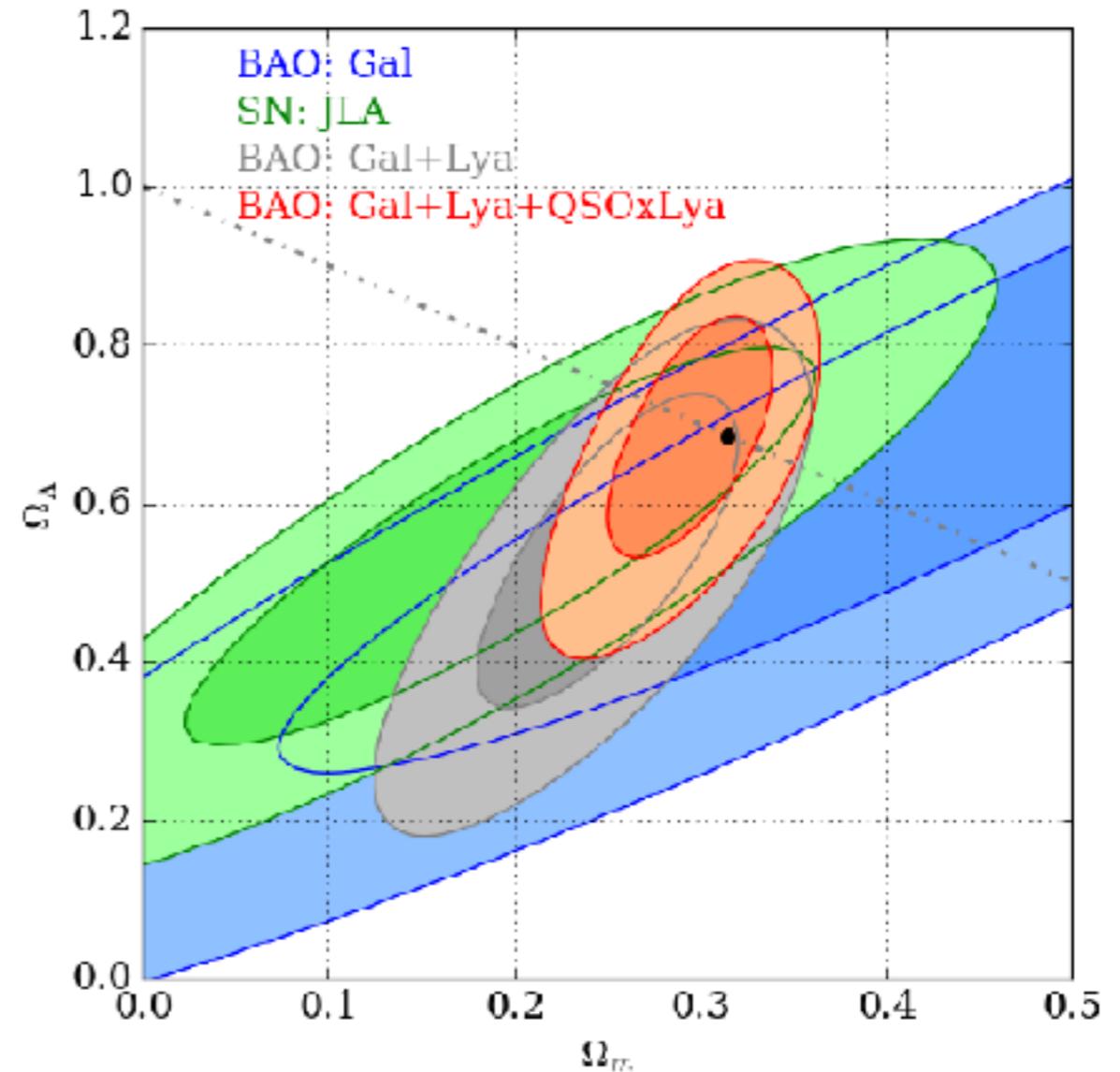
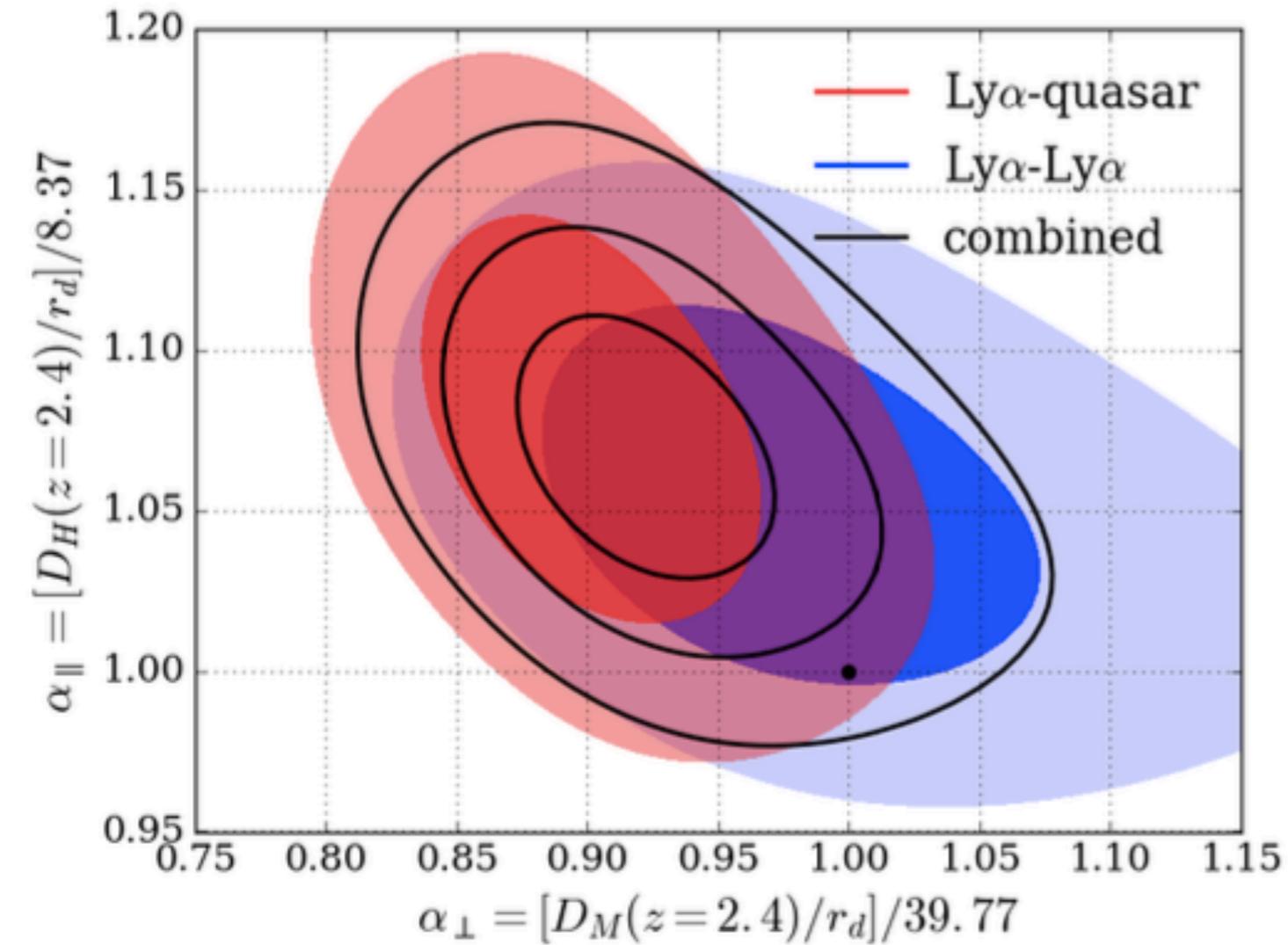
Helion du Mas des Bourboux
(Moved from Saclay to Utah)

dMdB et al. (2017) BAO
from DR12 QSO x Ly α





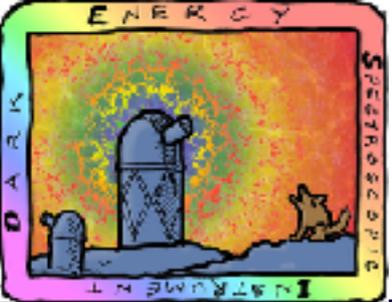
Combined BOSS BAO



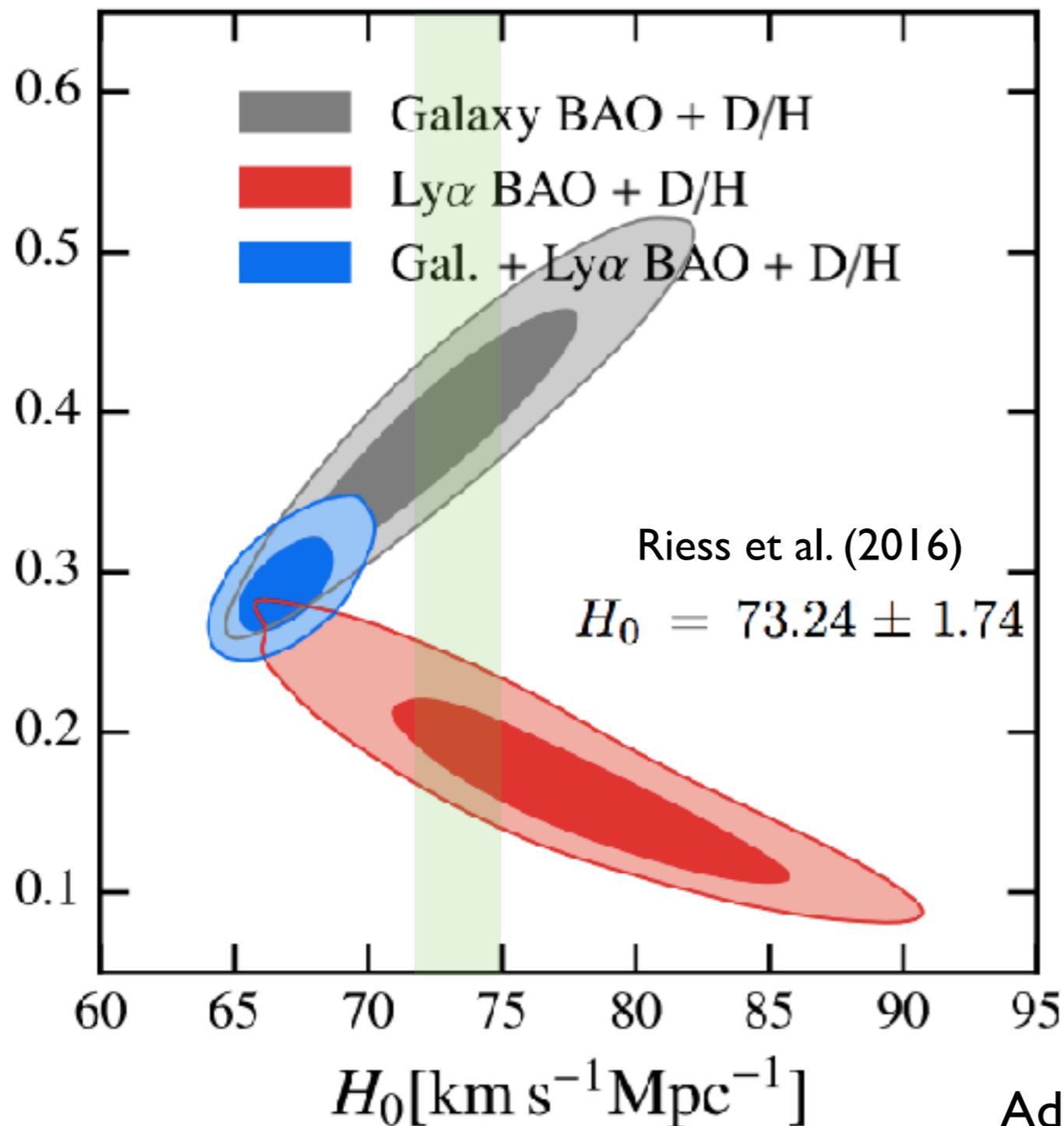
In a flat Λ CDM model

$$\Omega_m = 0.292 \pm 0.019 \quad \text{BAO}$$

$$\Omega_m = 0.315 \pm 0.017 \quad \text{Planck}$$



BAO and the H_0 tension

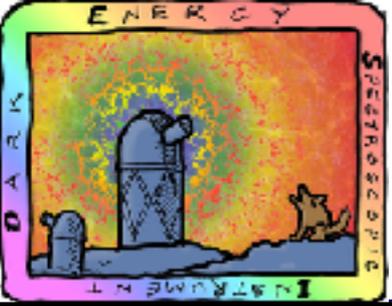


Planck + LCDM predicts value of H_0 lower than that from local expansion (Riess et al. 2016)

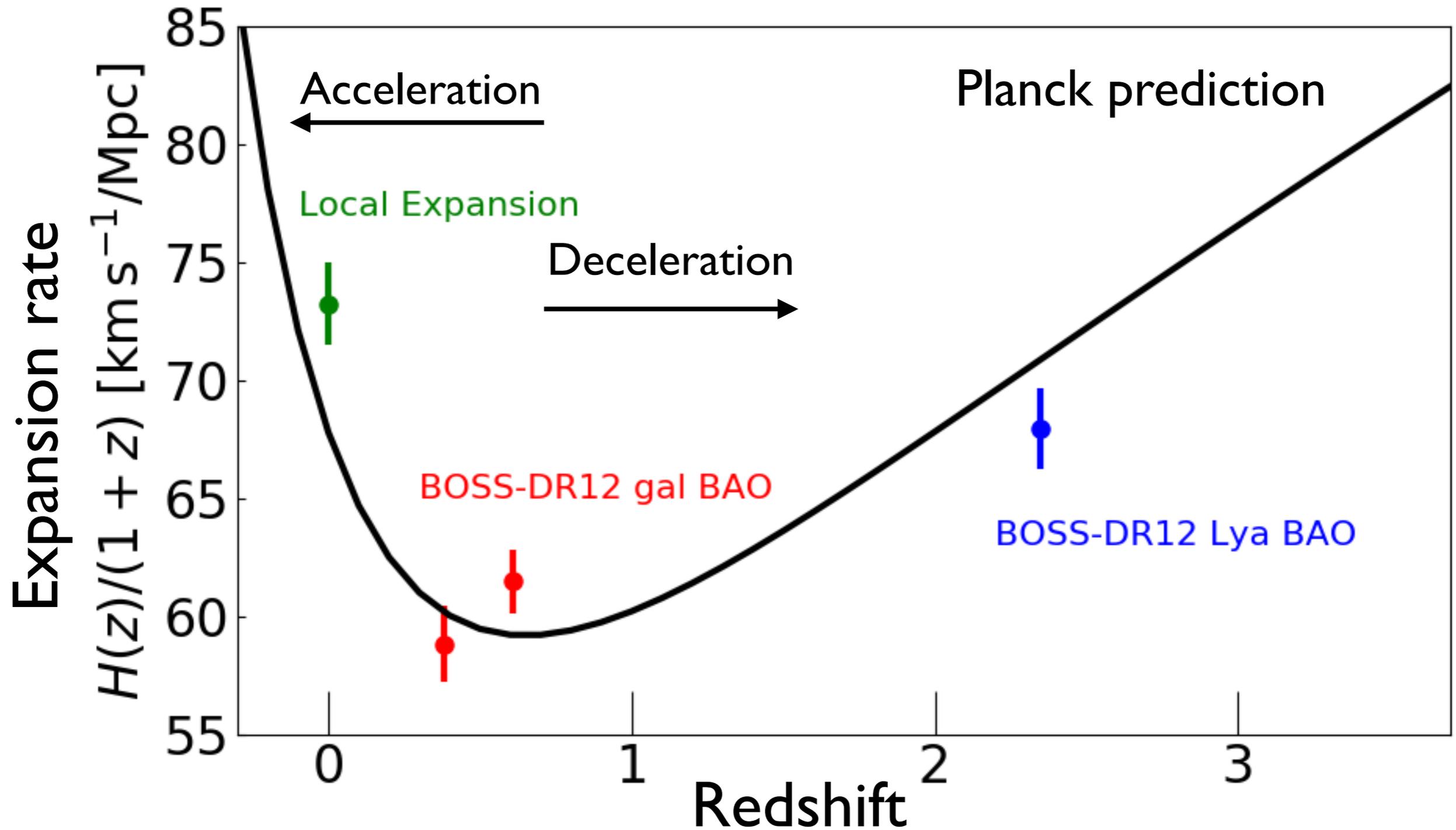
BAO + LCDM constraint Ω_m and $H_0 r_s$ (sound horizon, size of ruler)

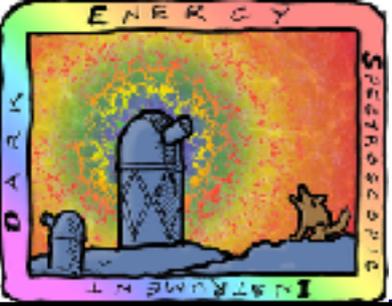
With BBN prior on Ω_b we can break degeneracy and measure H_0 from BAO

Addison et al. (2017)



BOSS Lyman- α BAO

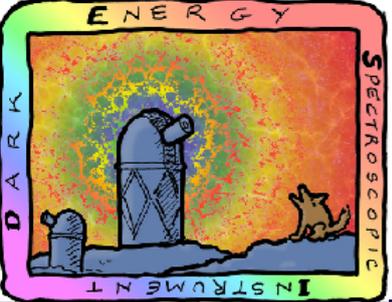




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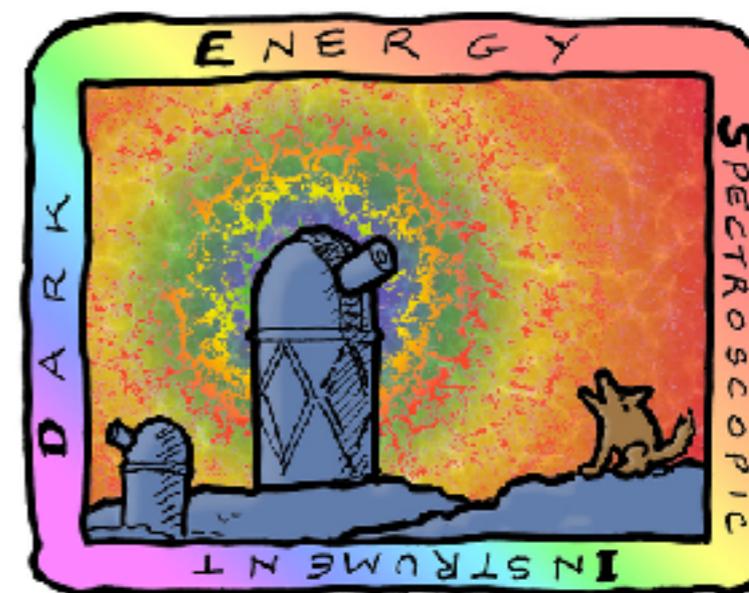
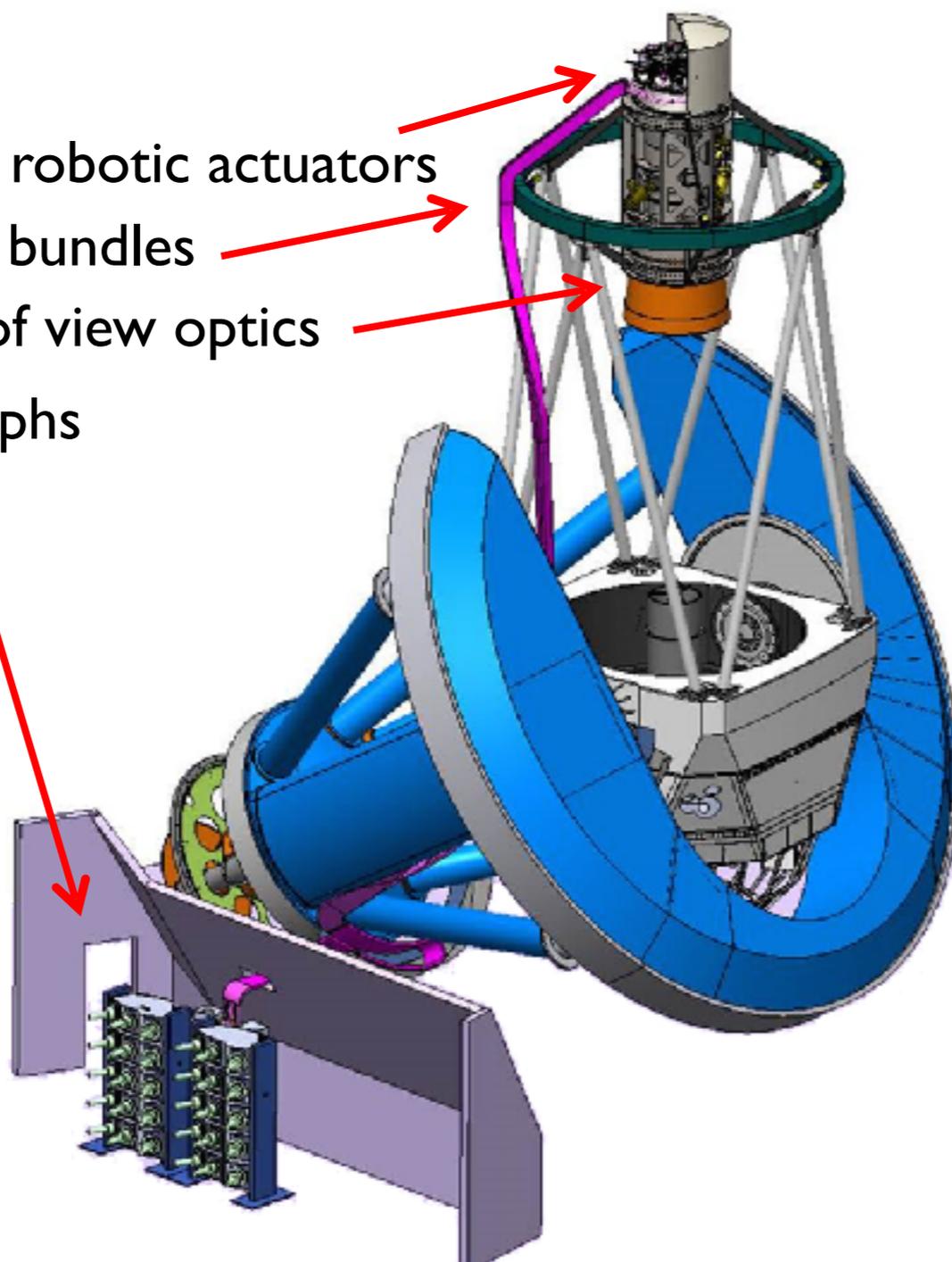


Dark Energy Spectroscopic Instrument



- 5000 fibers in robotic actuators
- 10 fiber cable bundles
- 3.2 deg. field of view optics
- 10 spectrographs

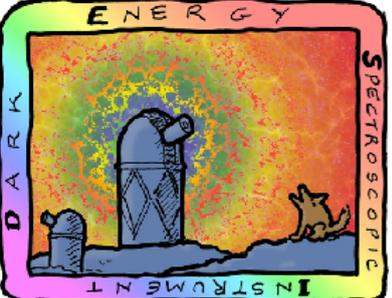
Readout
& Control



Mayall 4m Telescope
Kitt Peak (Tucson, AZ)

Increase BOSS dataset by an
order of magnitude

Scheduled to start in 2019

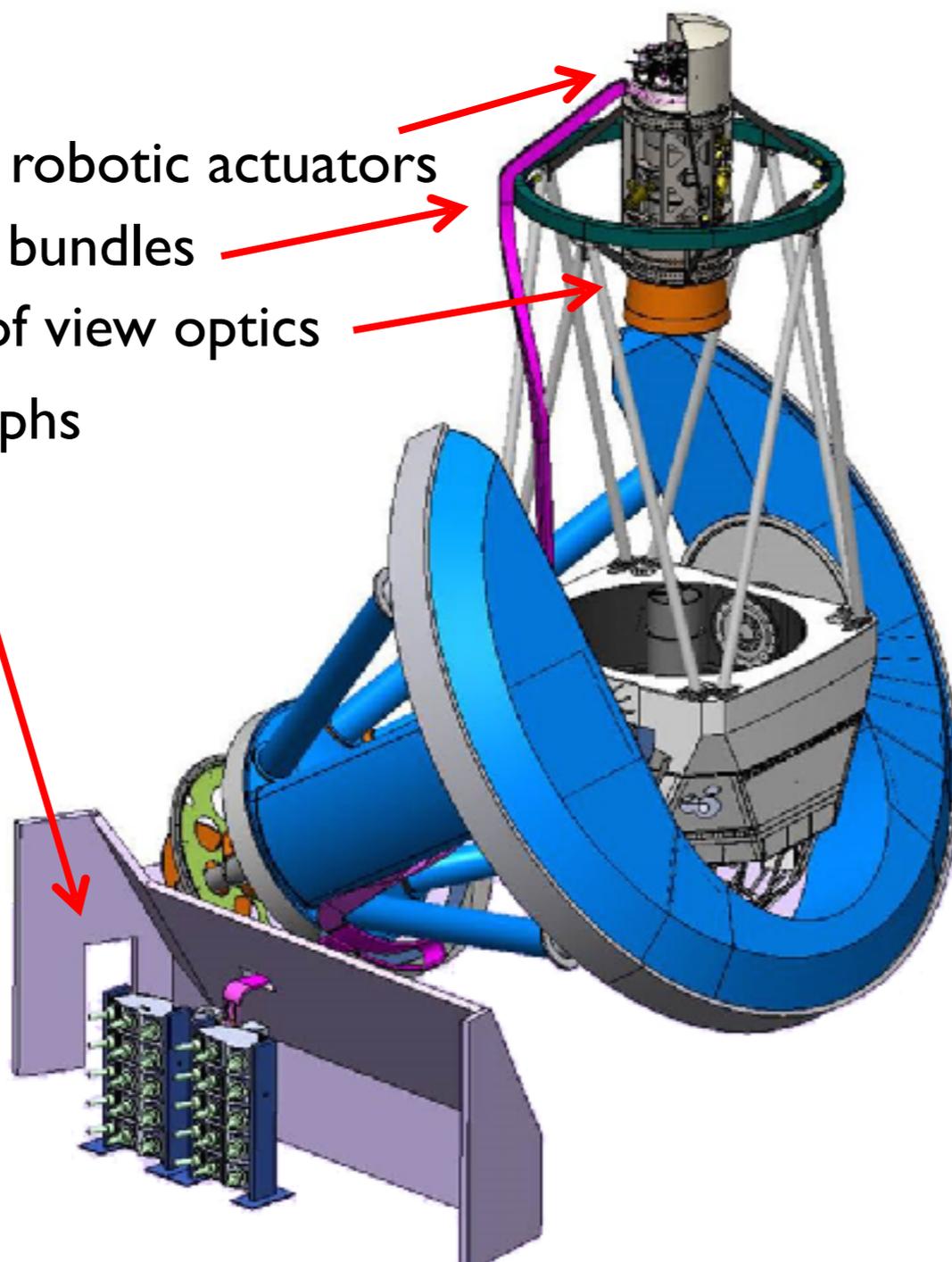


Dark Energy Spectroscopic Instrument

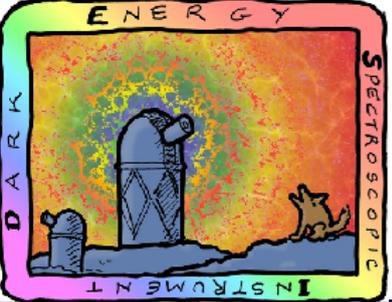


- 5000 fibers in robotic actuators
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- 3.2 deg. field of view optics
- 10 spectrographs

Readout
& Control



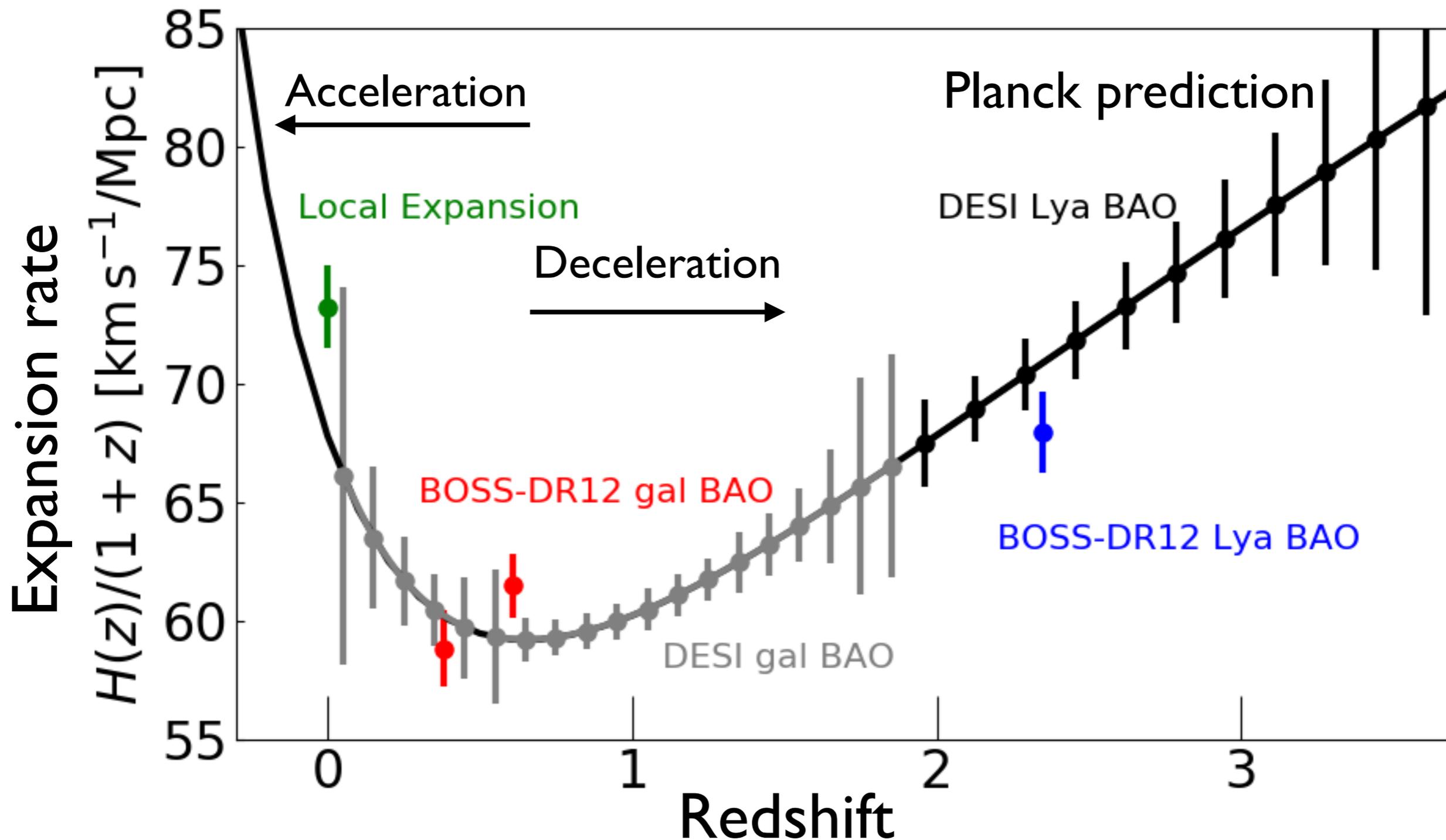
Lens in cell, UCL, March 2018

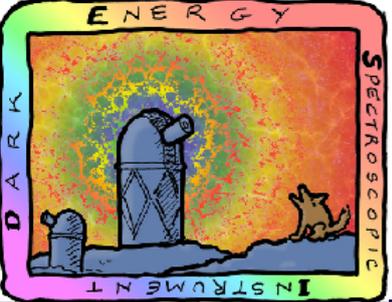


Dark Energy Spectroscopic Instrument



DESI projections (Font-Ribera++ 2014b)

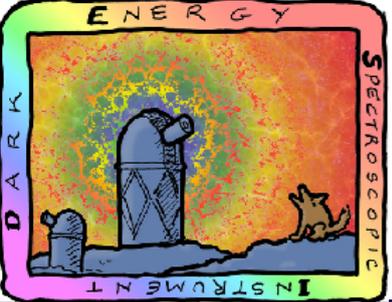




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DESI Lyman- α forest



White paper on BAO systematics

Led by: Nicolas Busca (LPNHE), Andreu Font-Ribera (UCL), Julien Guy (LBNL) and Anže Slosar (BNL)

Lessons learned from BOSS/eBOSS. Need to be ready for DESI!

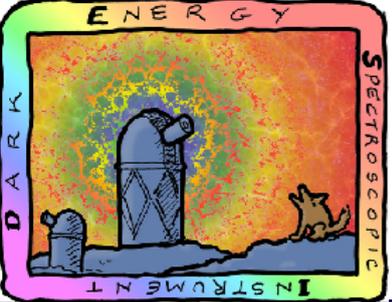
4 type of simulations needed — DESI Ly- α mocks

9 astrophysics systematics

7 instrumental systematics

6 analysis systematics

Translating now into cosmological simulations requirements



DESI Ly α mocks with CoLoRe



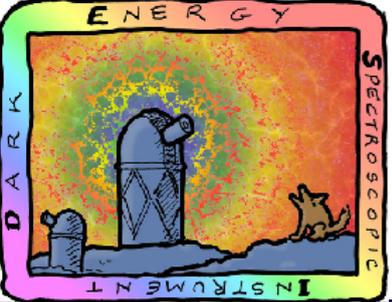
Mock realisations of the survey are extremely valuable:

- Test analysis pipeline: continuum fitting, covariance matrix
- Test potential systematics: metals, DLAs, sky residuals
- Forecast survey performance: help vs depth?

All Ly α BAO analyses in BOSS used mocks using an algorithm developed in Font-Ribera et al. (2012)

... but they do not have correlated quasars

DESI needs mocks with correct cross-correlation with quasars!



DESI Ly α mocks with CoLoRe



CoLoRe: Cosmological Lognormal Realizations

- Developed by David Alonso (Oxford) for LSST
- Galaxy clustering, cosmic shear, intensity mapping...
- We have adapted it to also generate Ly α skewers



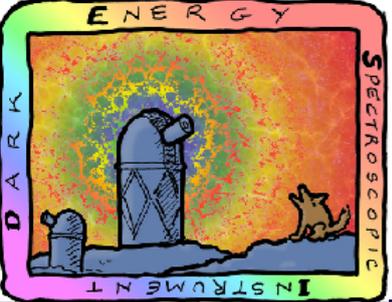
James Farr
(PhD @ UCL)

How does it work?

- Define a (really) large box covering all sky to $z=4$
- Generate a random Gaussian field using linear density $P(k)$
- Generate light-cone with linear growth
- Lognormal transformation + Poisson sampling to get halos
- Extract density and velocity towards each halo

Performance:

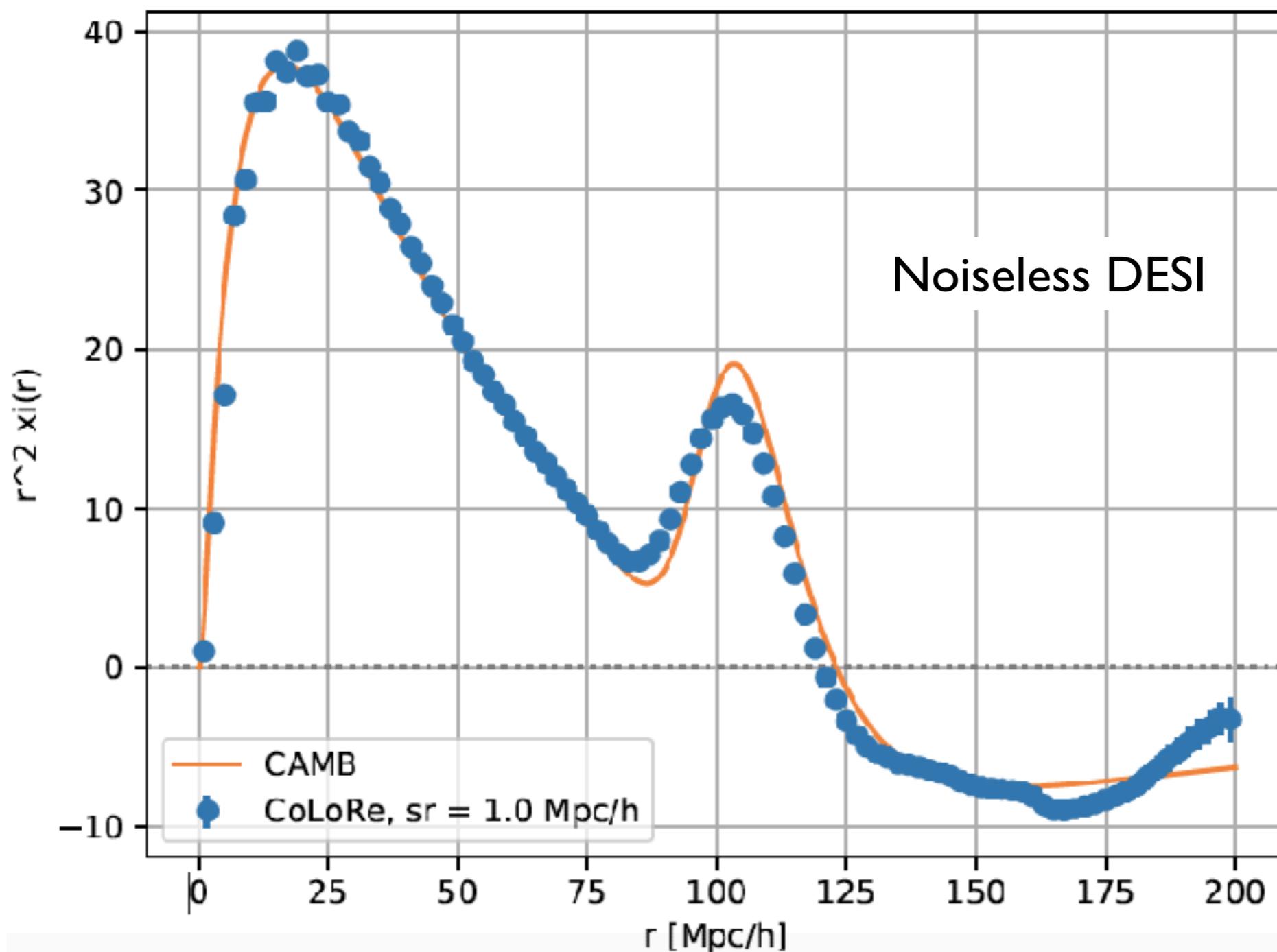
- MPI parallelised: can generate 8192^3 using 256 nodes at NERSC
- Cell sizes still too large, we need to add extra uncorrelated power



DESI Ly α mocks with CoLoRe



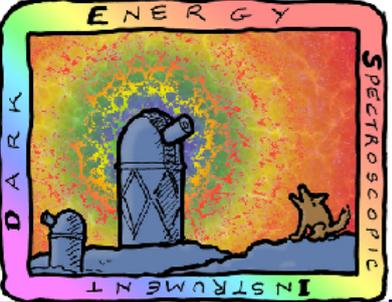
correlation function, $0.0 < \mu < 1.0$



James Farr
(PhD @ UCL)

Work in progress:

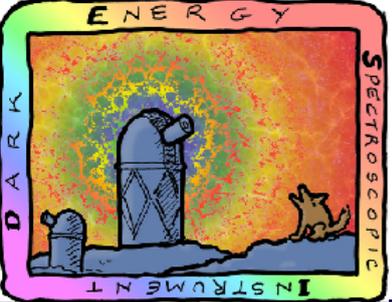
- Model smoothing
- Add RSD
- Extra power
- Add contaminants



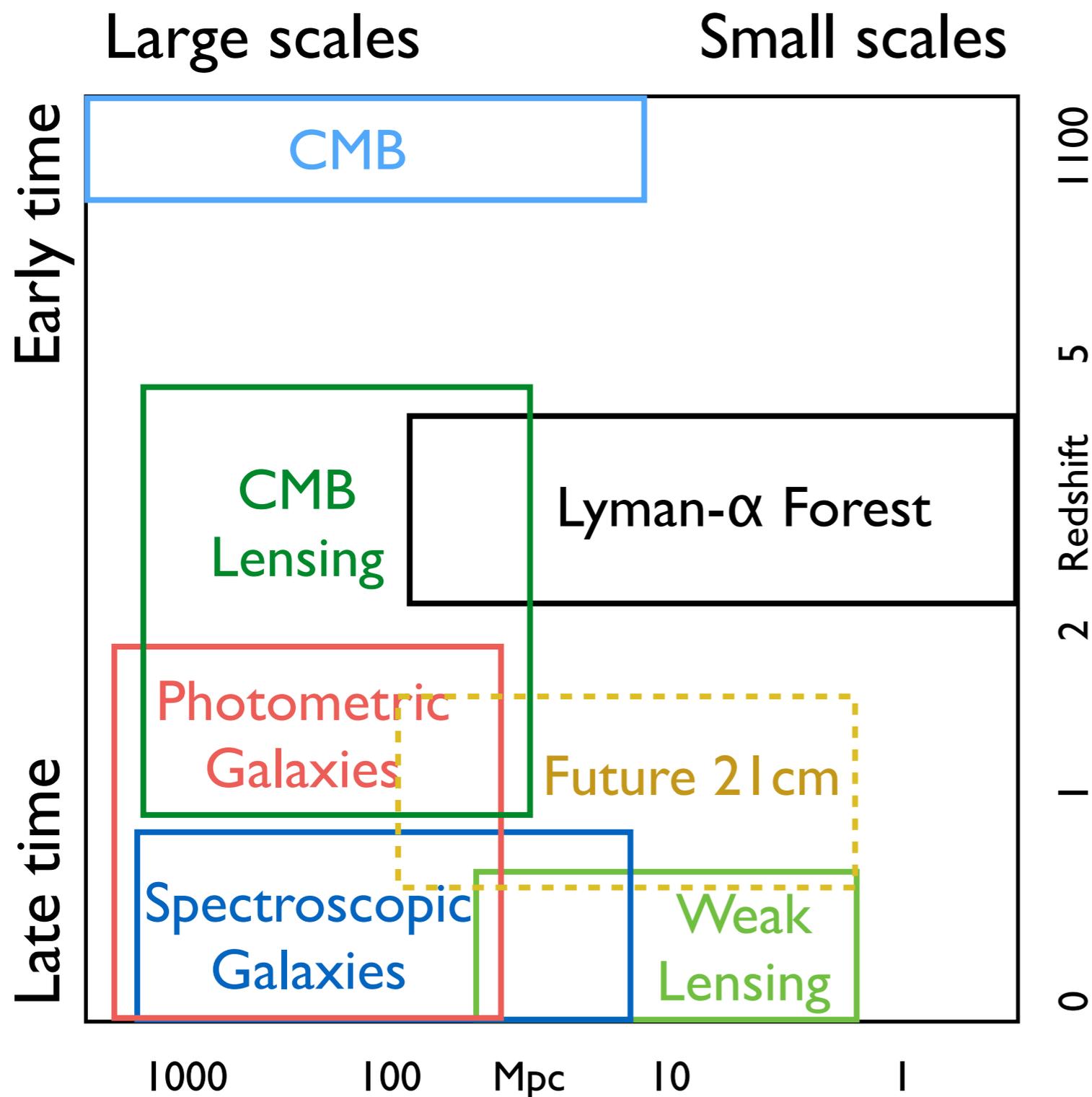
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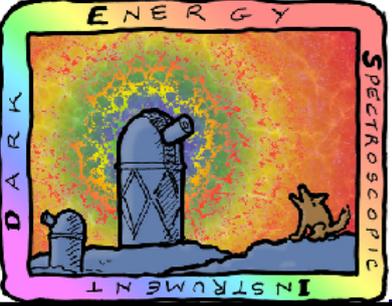


Small scale clustering

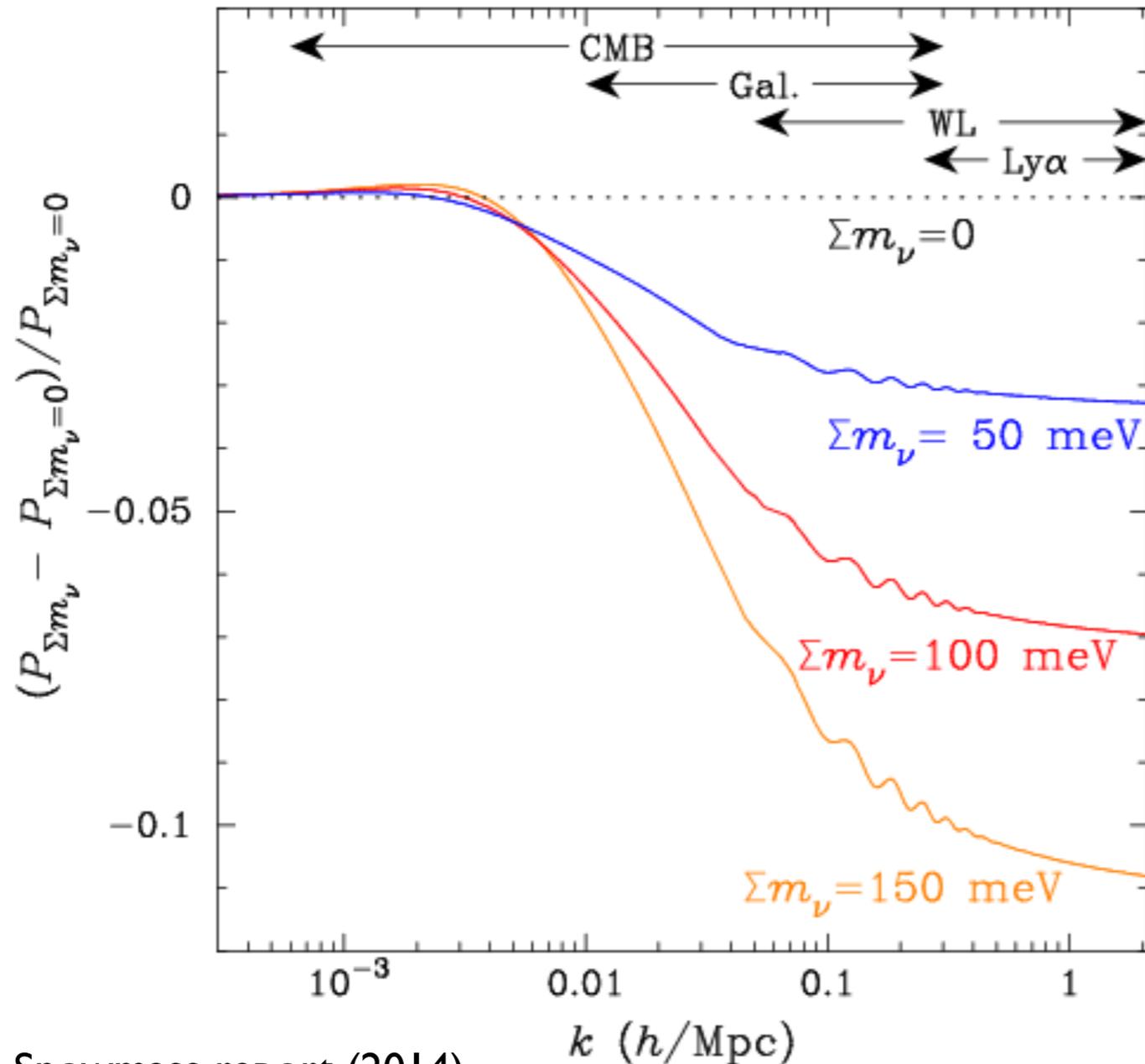


Lyman- α forest offers a unique window to study small scale clustering

- Combined with CMB, it allows us to study:
- shape of primordial $P(k)$
 - dark matter properties
 - neutrino mass



Small scale clustering

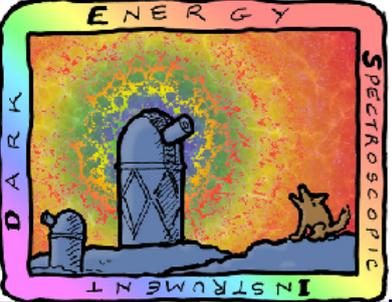


Snowmass report (2014)

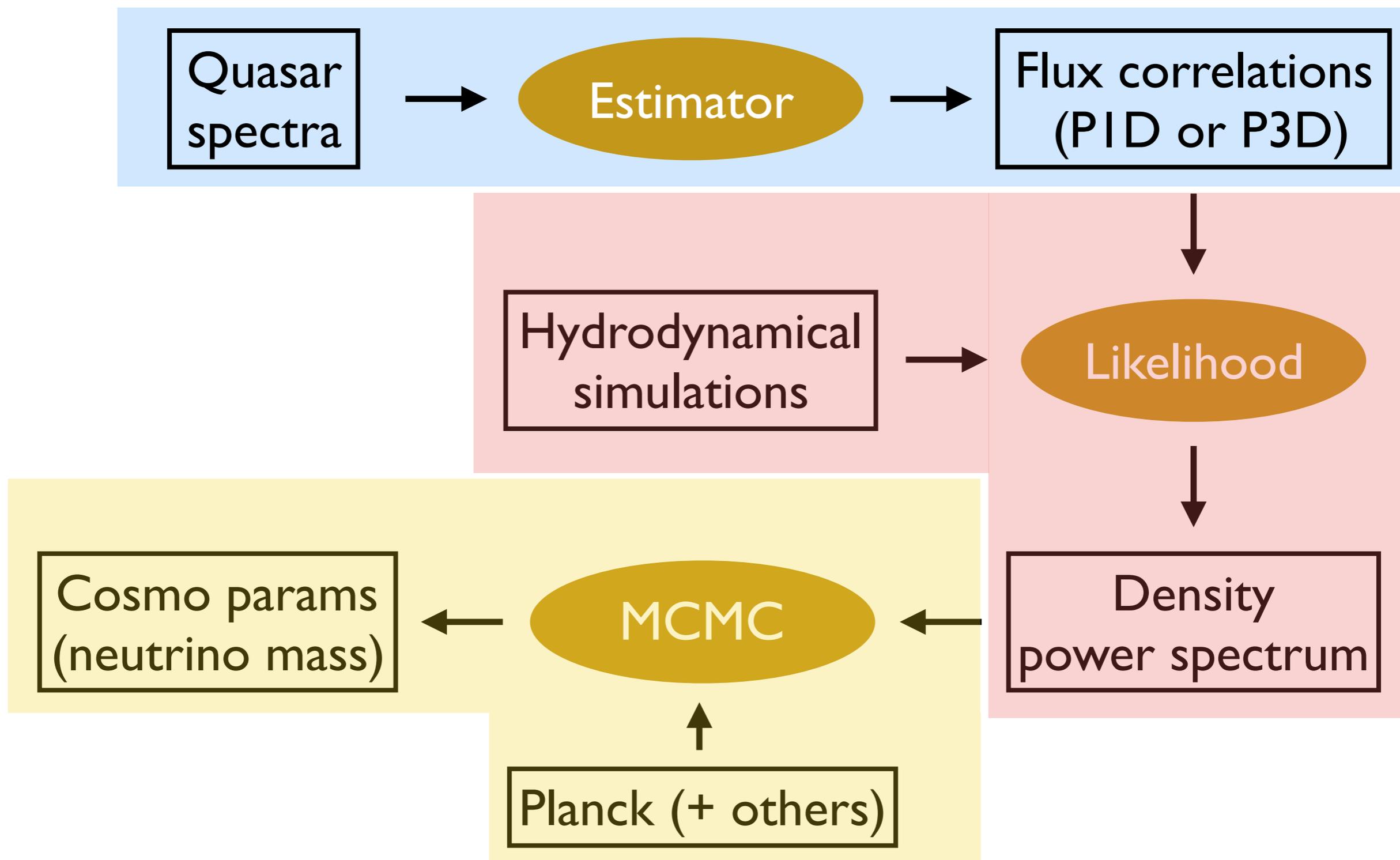
Massive neutrinos are hot dark matter, do not cluster on small scales

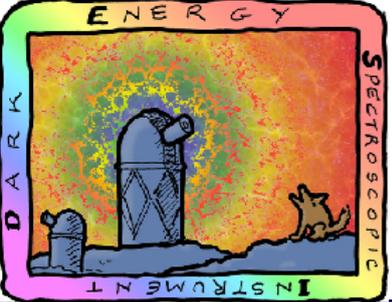
Comparing the power on large and small scales we can constraint neutrino masses

Best constraints from Planck + BOSS Ly α
 $\Sigma m_\nu < 0.12 \text{ eV (95\%)}$
(Palanque-Desabrouille++ 2015)

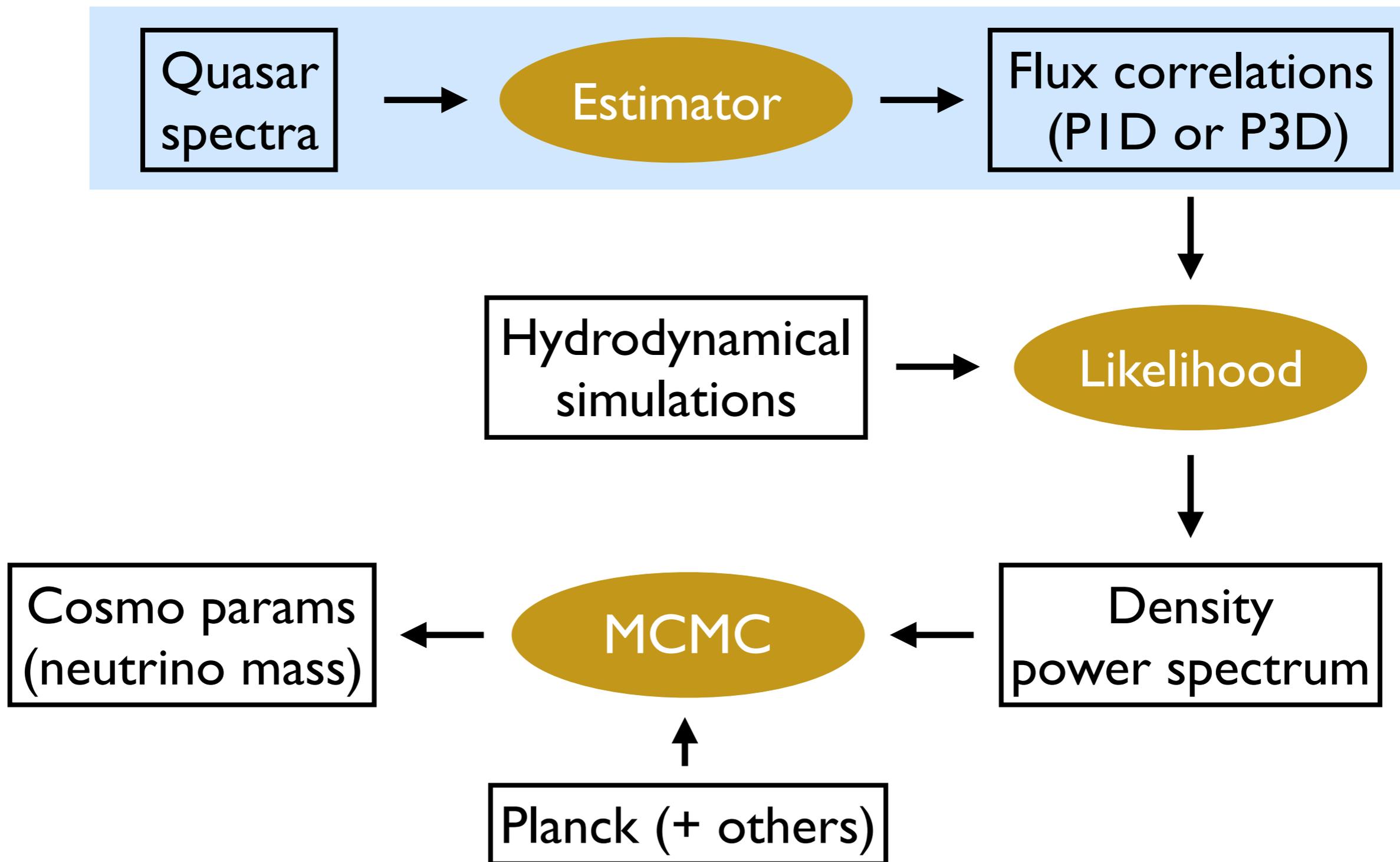


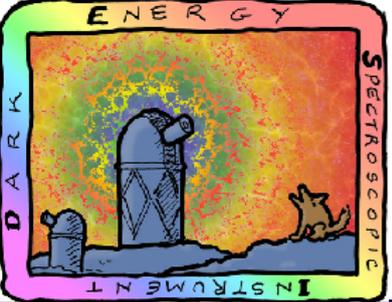
Small scale clustering





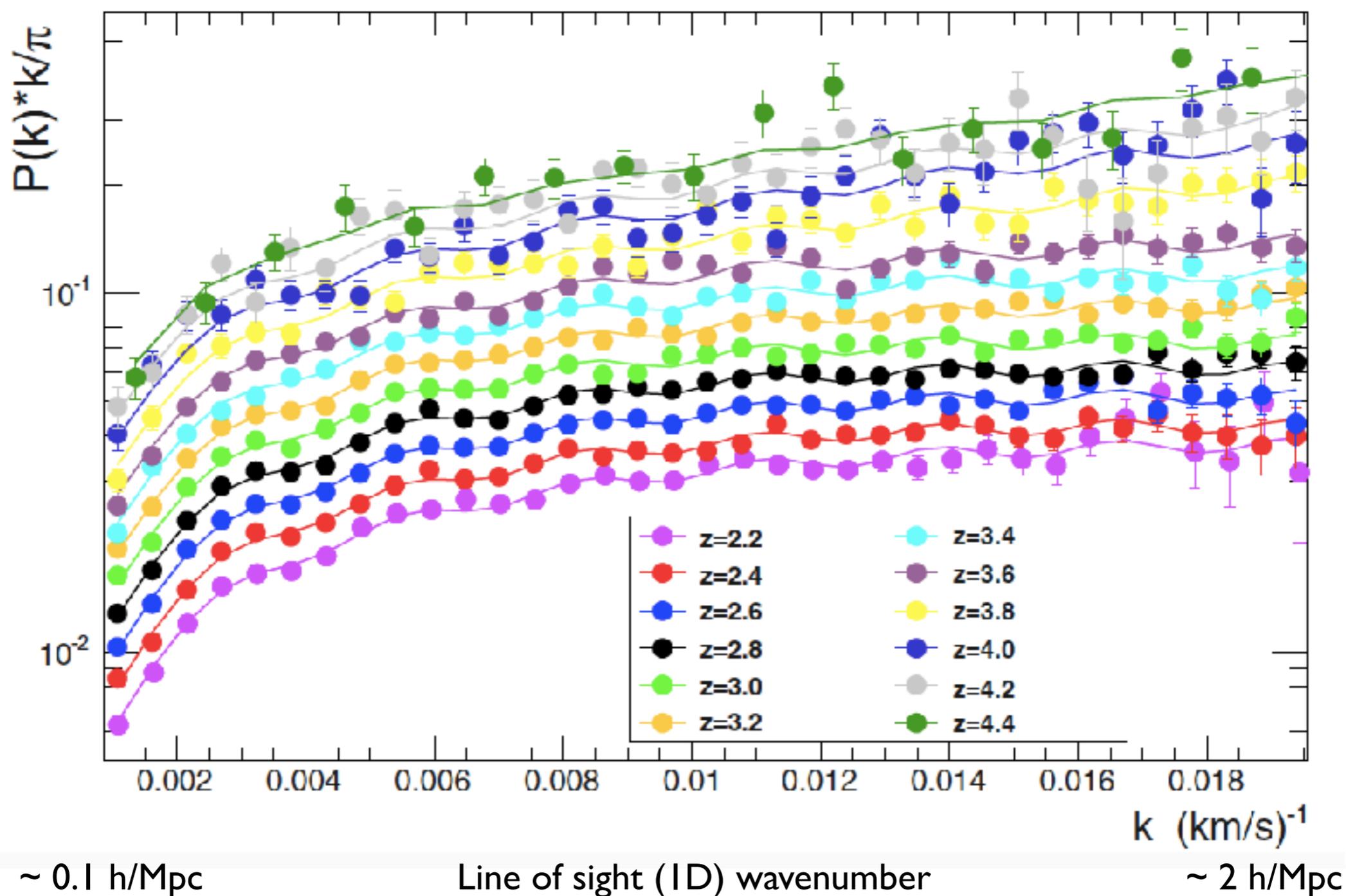
Small scale clustering

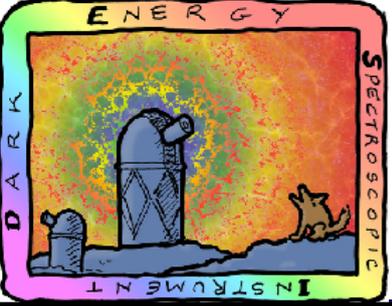




Estimators: ID $P(k)$

ID correlations, one skewer at a time (Palanque-Delabrouille et al. 2013)



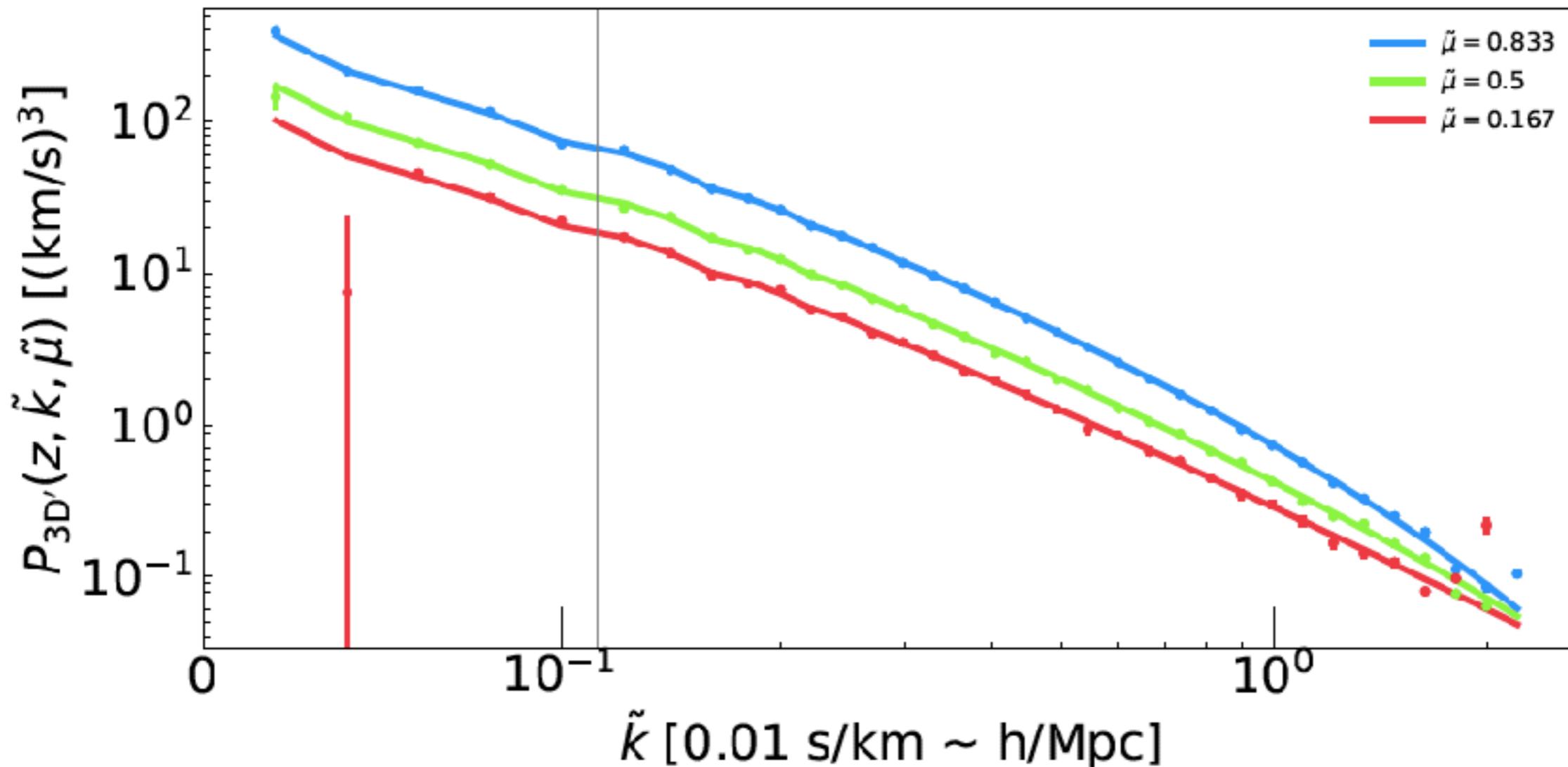


Estimators: 3D $P(k)$

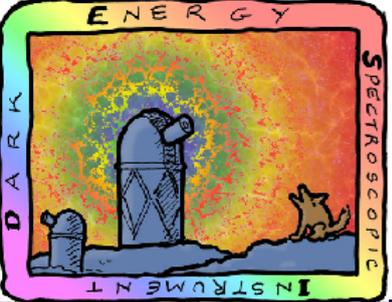
An efficient algorithm for estimating the 3D Ly α forest power spectrum

Andreu Font-Ribera ^{a,1,†} Patrick McDonald,^{2,‡} and Anže Slosar^{3,§}

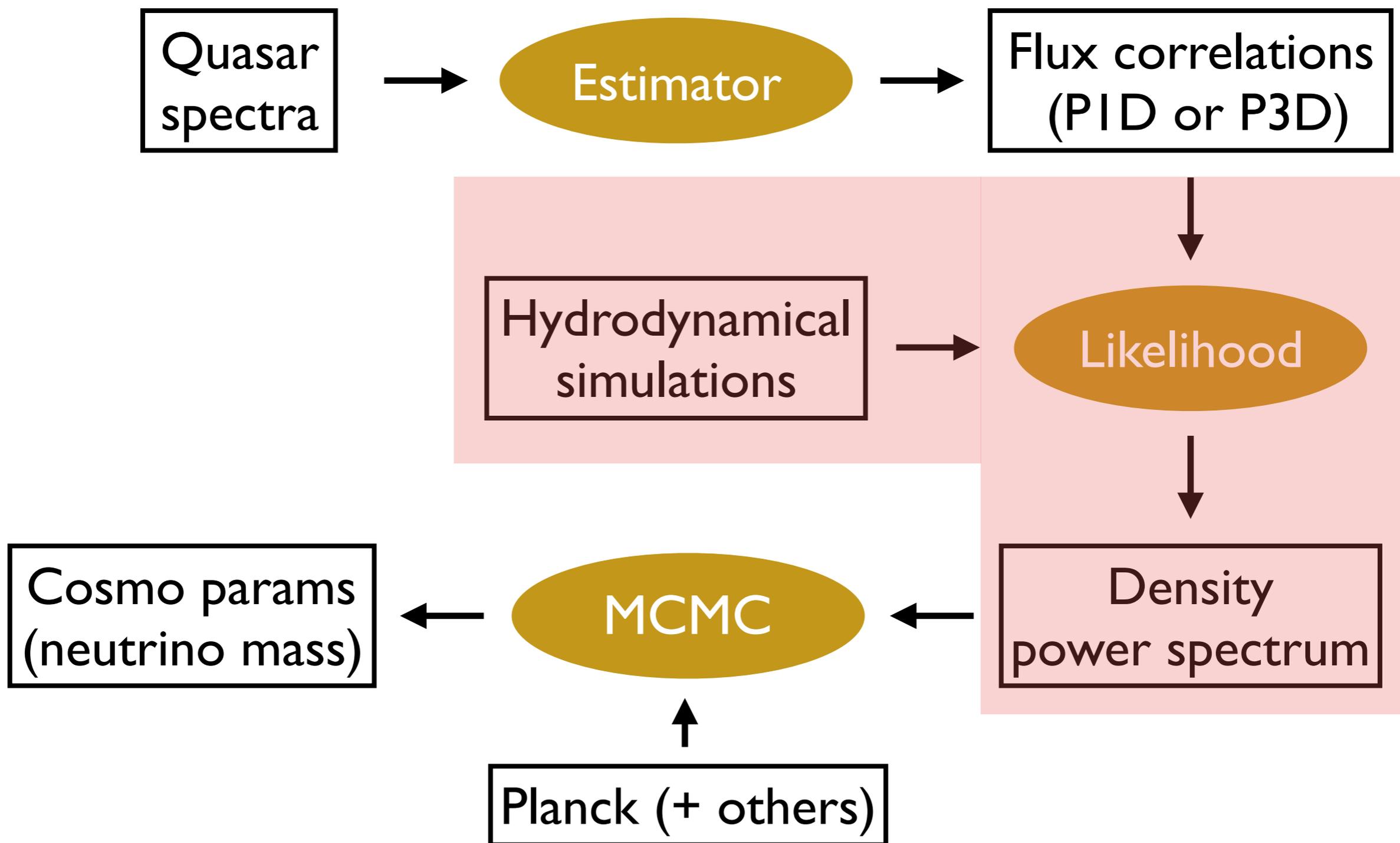
$z=2.30$

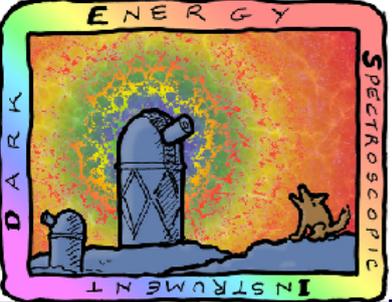


Measurement from 40 mock realisations of BOSS



Small scale clustering





Hydro simulations of Ly α

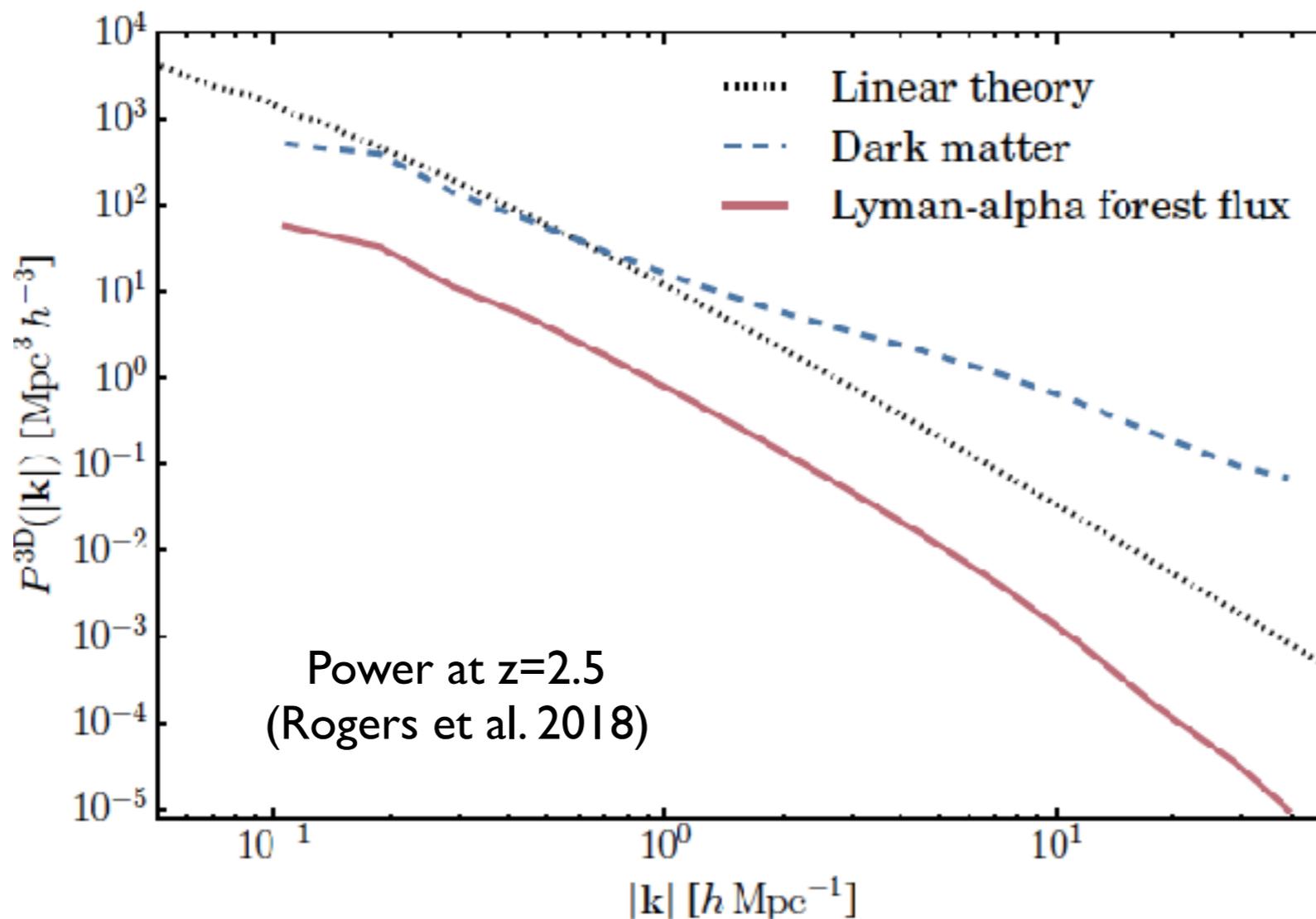


New program at UCL to measure neutrino mass from Ly α

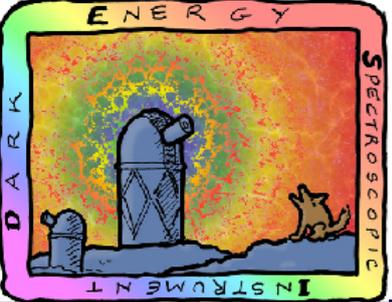
- MP-Gadget, by Yu Feng (Berkeley) & Simeon Bird (Riverside)
- Study effect of neutrinos on Ly α , and its degeneracies
- First proposal submitted to DiRAC (UK supercomputer)



Chris Pedersen
(PhD @ UCL)



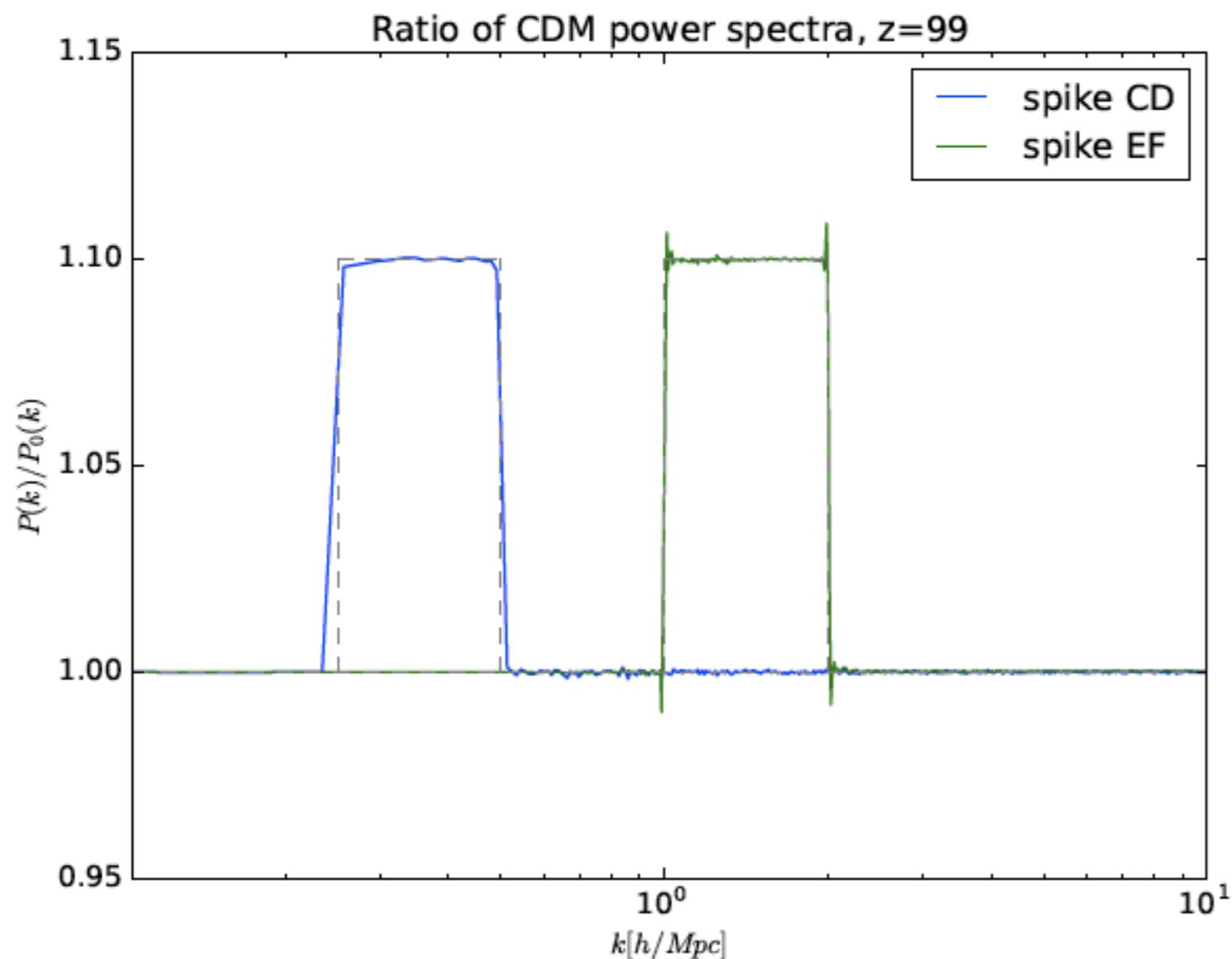
Why is the Ly α forest a good tracer of the linear density field?



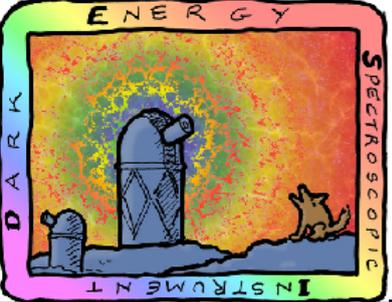
Hydro simulations of Ly α



First project: why is the Ly α forest a good tracer of the linear density field?



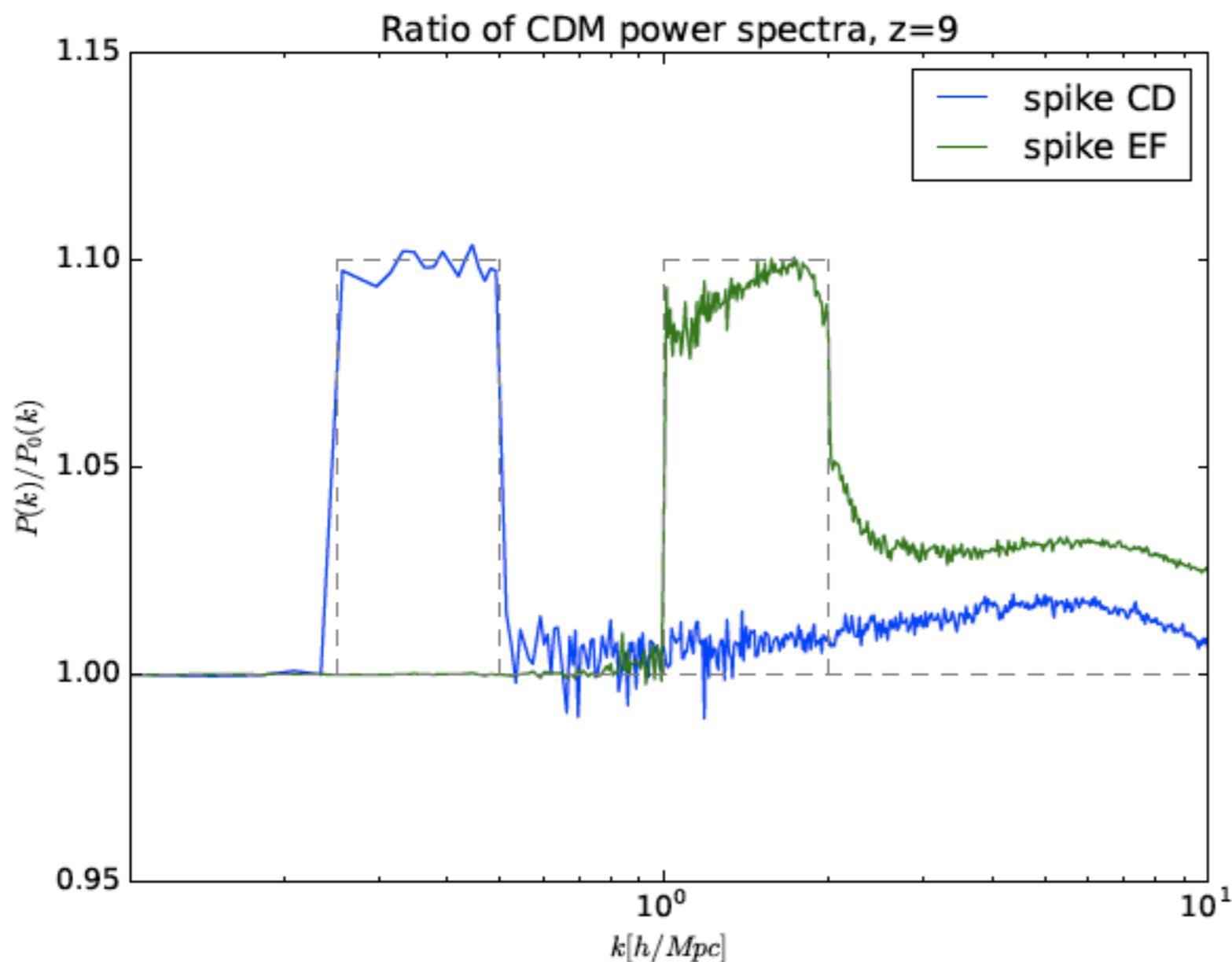
Generate simulations with features in linear power



Hydro simulations of Ly α

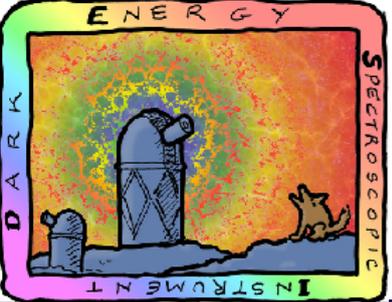


First project: why is the Ly α forest a good tracer of the linear density field?



Generate simulations with features in linear power

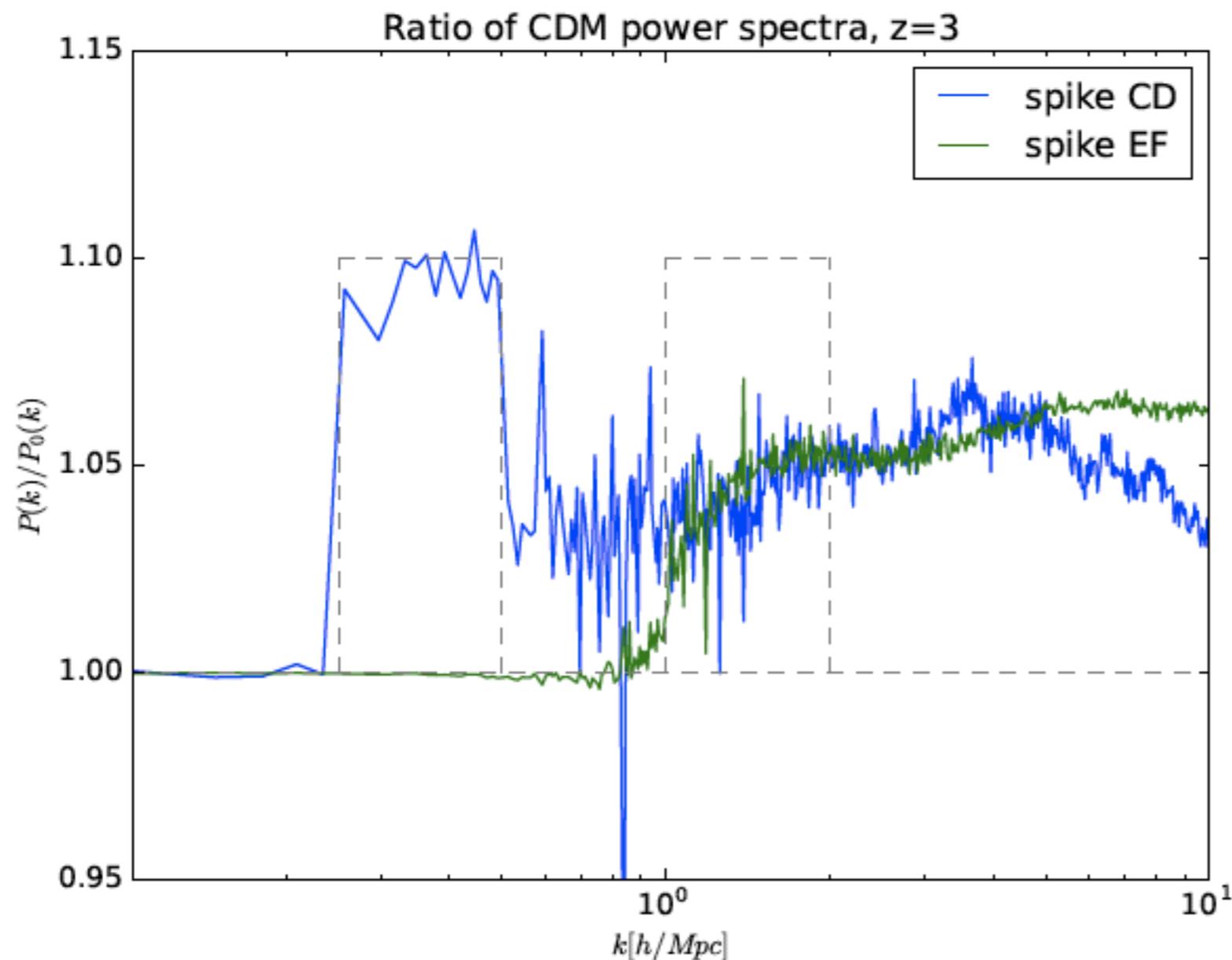
Information is lost in the density power spectrum due to non-linearities (mode-coupling)



Hydro simulations of Ly α

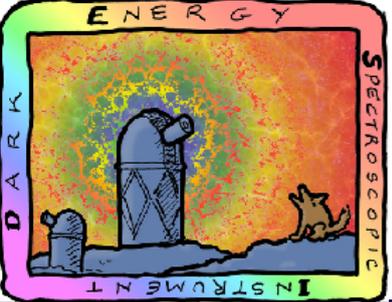


First project: why is the Ly α forest a good tracer of the linear density field?



Generate simulations with features in linear power

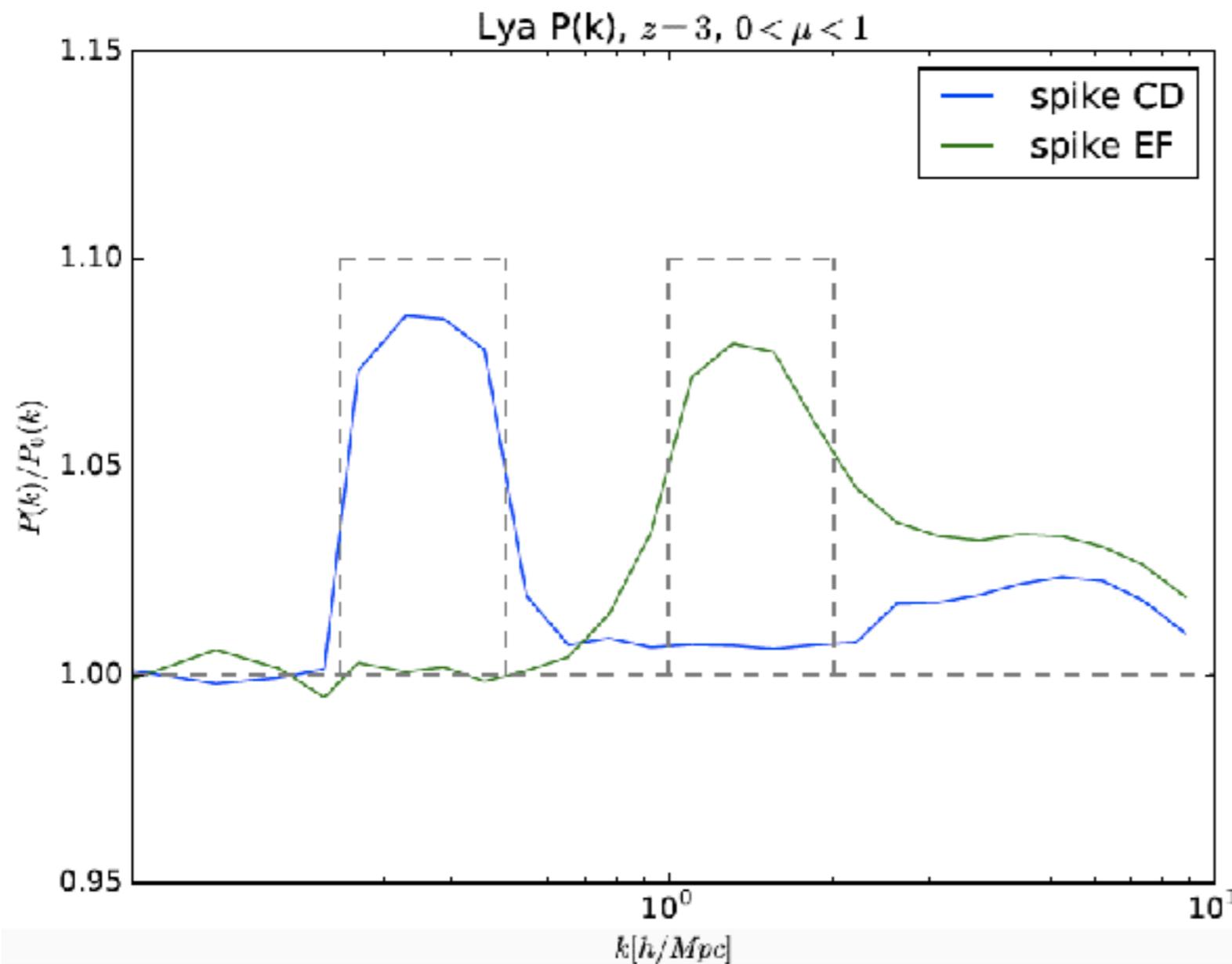
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Hydro simulations of Ly α



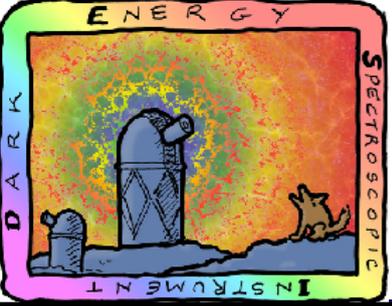
First project: why is the Ly α forest a good tracer of the linear density field?



Generate simulations with features in linear power

Information is lost in the density power spectrum due to non-linearities (mode-coupling)

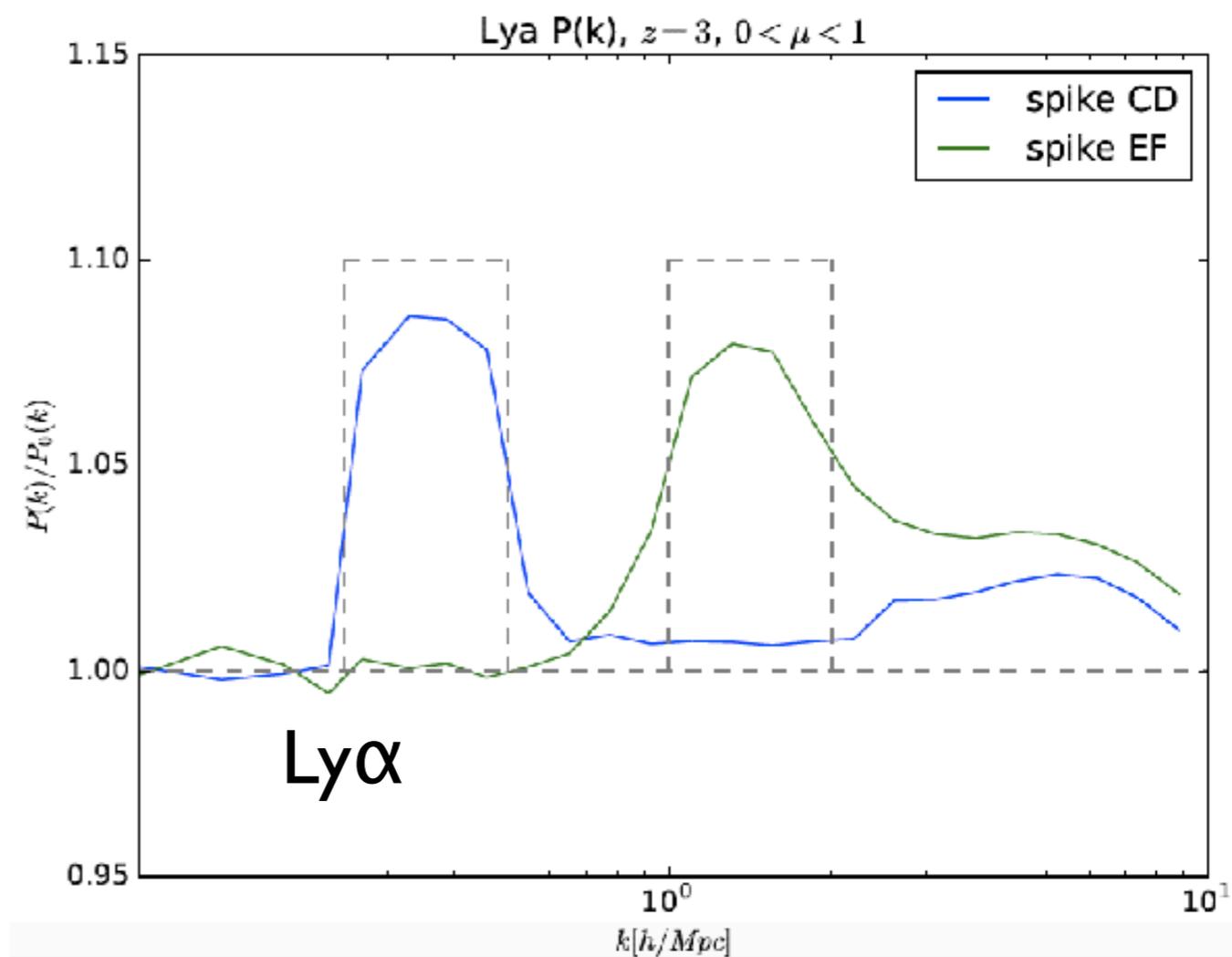
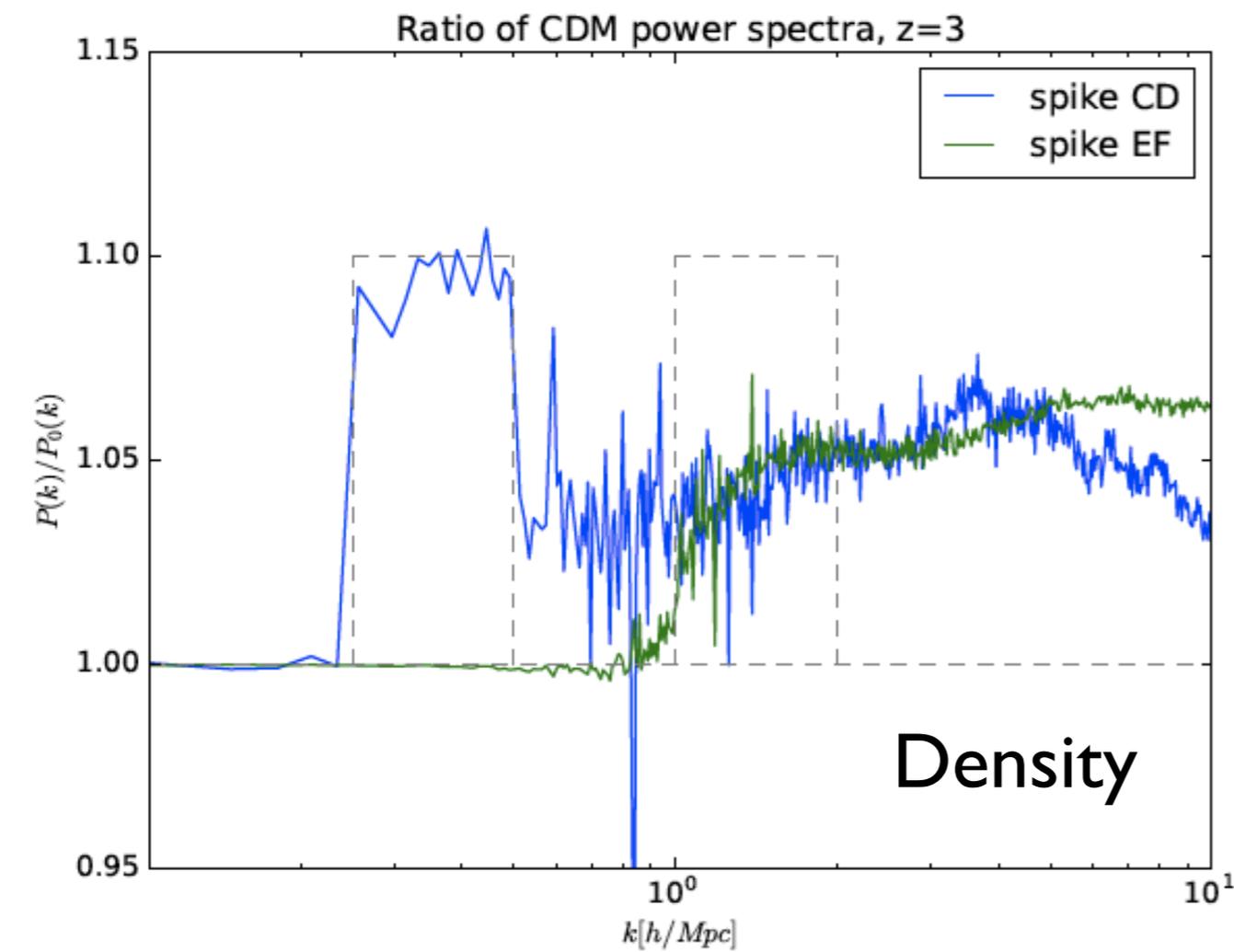
Ly α 3D power is less affected by non-linearities



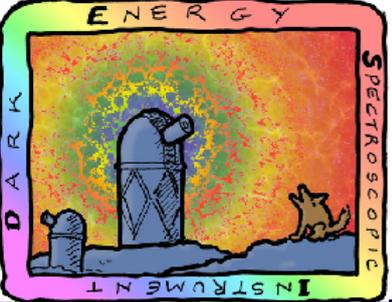
Hydro simulations of Ly α



First project: why is the Ly α forest a good tracer of the linear density field?



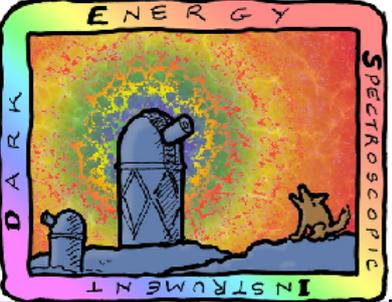
Ly α is a better tracer of initial conditions than density!



Outline

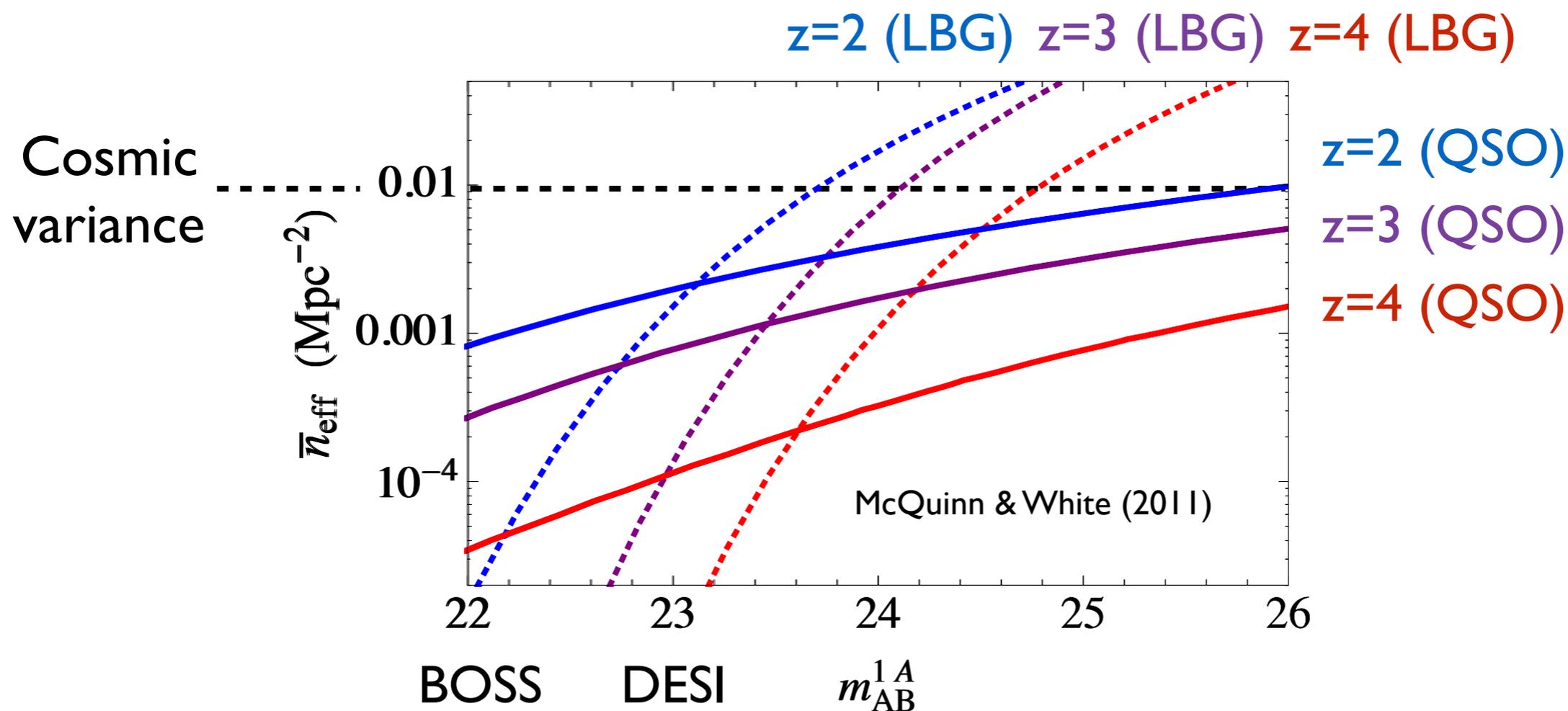


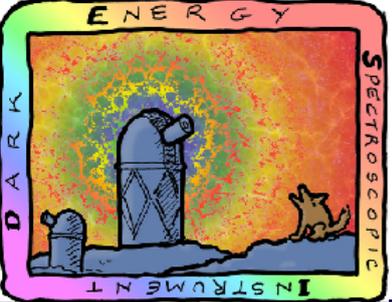
- Baryon Acoustic Oscillations (BAO)
- Baryon Oscillation Spectroscopic Survey (BOSS)
- The Lyman- α forest (Ly α)
- Ly α BAO results from BOSS
- Dark Energy Spectroscopic Instrument (DESI)
 - DESI Challenges: systematics
 - DESI Opportunities: small scale clustering
- **After-DESI (2025)**



After-DESI (2025)

- Galaxy surveys running out of sky: DESI cosmic variance limited to $z < 1.4$
- Not the case for Ly- α surveys: errors limited by density of lines of sight
- Quasars are rare, but we can also use galaxies as backlight (see CLAMATO)



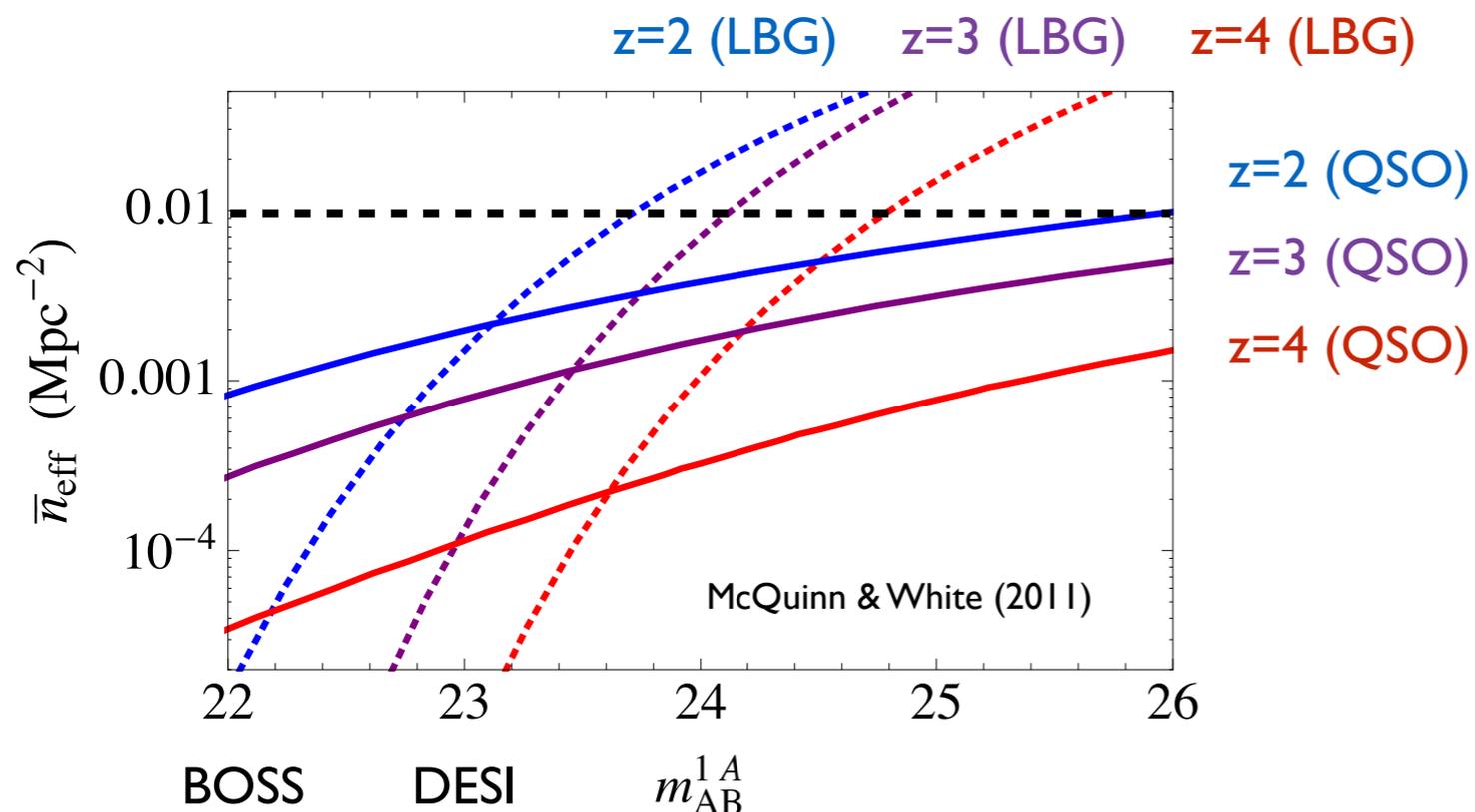


After-DESI (2025)

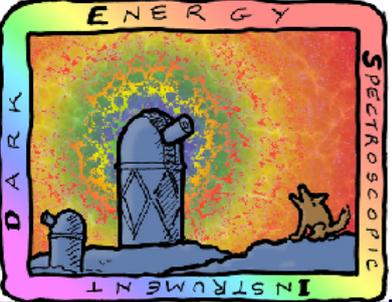


- Galaxy surveys running out of sky: DESI cosmic variance limited to $z < 1.4$
- Not the case for Ly- α surveys: errors limited by density of lines of sight
- Quasars are rare, but we can also use galaxies as backlight (see CLAMATO)

Lyman- α science is just starting!



- Still possible an order of magnitude increase
- LSST will solve target selection by 2025
- Complementary to WFIRST, Euclid and CMB-S4



Summary



Data analysis for BOSS (2009-2017)

- Co-chaired BOSS Ly α working group (2012-2017)
- Novel method to generate mock Ly α surveys (Font-Ribera++2012a)
- Pioneered Ly α -QSO cross-correlation (Font-Ribera++ 2012b,2013)
- First BAO in correlations of different tracers (Font-Ribera++2014a)

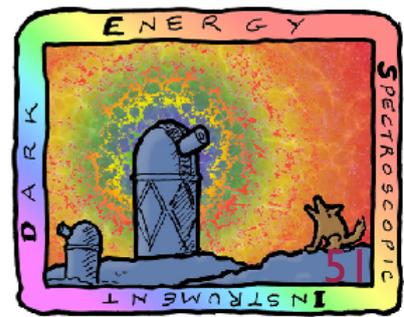
Essential development for DESI (2017-2020)

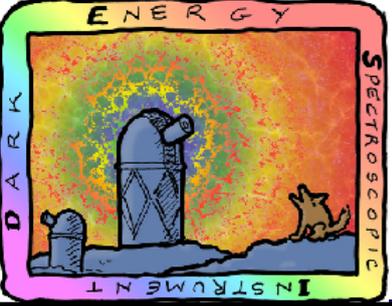
- Co-chaired DESI Ly α working group (2017-)
- Algorithm to measure Ly α power on all scales (Font-Ribera++ 2018)
- Transform theoretical models to reach sub-percent precision

Bright future: DESI (2020-2025) ...and more!

- Sub-percent measurement of expansion over cosmic time
- Detect effect of neutrino mass
- Best constraints on small scale primordial power spectrum
- Combination with WFIRST, Euclid, LSST and CMB-S4

Extra slides



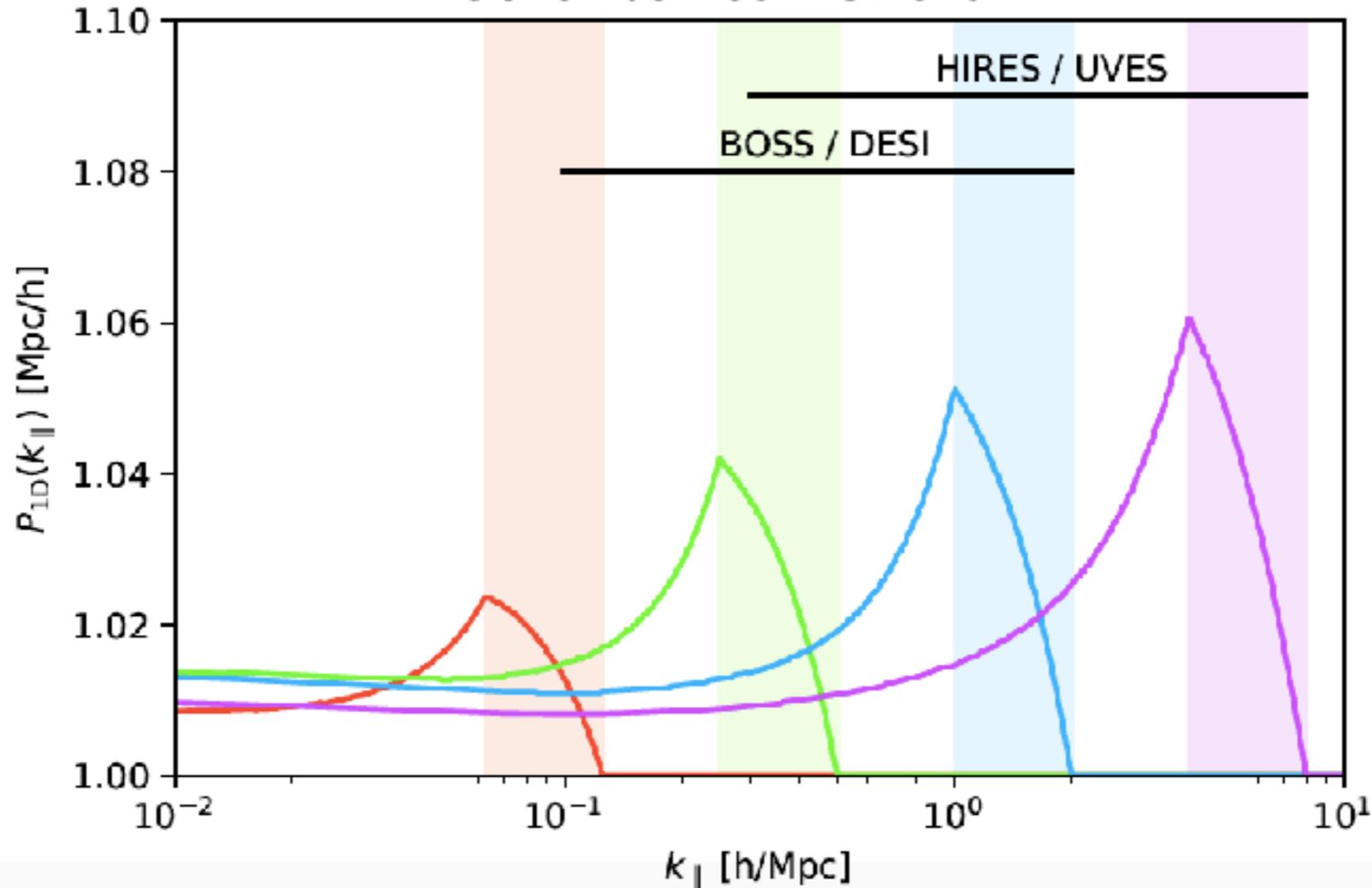


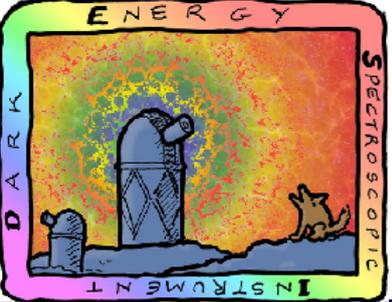
Estimators: 1D $P(k)$

$P_{1D}(k_{\parallel})$ mixes several 3D modes into a single k_{\parallel}

$$P_{1D}(k_{\parallel}) = \int dr_{\parallel} e^{ik_{\parallel}r_{\parallel}} \xi(r_{\parallel}, \mathbf{r}_{\perp} = 0) = \frac{1}{(2\pi)^2} \int d\mathbf{k}_{\perp} P_F(k_{\parallel}, \mathbf{k}_{\perp})$$

Relation between P3D and P1D





Forecasts



Just like galaxies, the forest is a tracer of the density field

Galaxy clustering

$$P_g(\mathbf{k}) = b_g^2 (1 + \beta_g \mu_k^2)^2 P(k)$$

$$\sigma_g^2(\mathbf{k}) = 2 \left(P_g(\mathbf{k}) + n_g^{-1} \right)^2$$

Forest clustering

$$P_F(\mathbf{k}) = b_F^2 (1 + \beta_F \mu_k^2)^2 P(k)$$

$$\sigma_F^2(\mathbf{k}) = 2 \left(P_F(\mathbf{k}) + \frac{P^{1D}(k\mu) + P_N}{n_q^{2D}} \right)^2$$

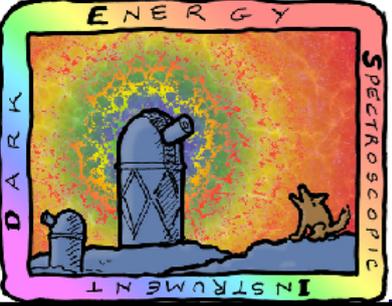
Cross-correlation

$$P_{FQ}(\mathbf{k}) = b_F b_Q (1 + \beta_F \mu_k^2) (1 + \beta_Q \mu_k^2) P(k)$$

$$\sigma_{FQ}^2(\mathbf{k}) = P_{FQ}^2(\mathbf{k}) + \left(P_F(\mathbf{k}) + \frac{P^{1D}(k\mu) + P_N}{n_q^{2D}} \right) \left(P_Q(\mathbf{k}) + \frac{1}{n_q^{3D}} \right)$$

Shot noise

Cosmic variance



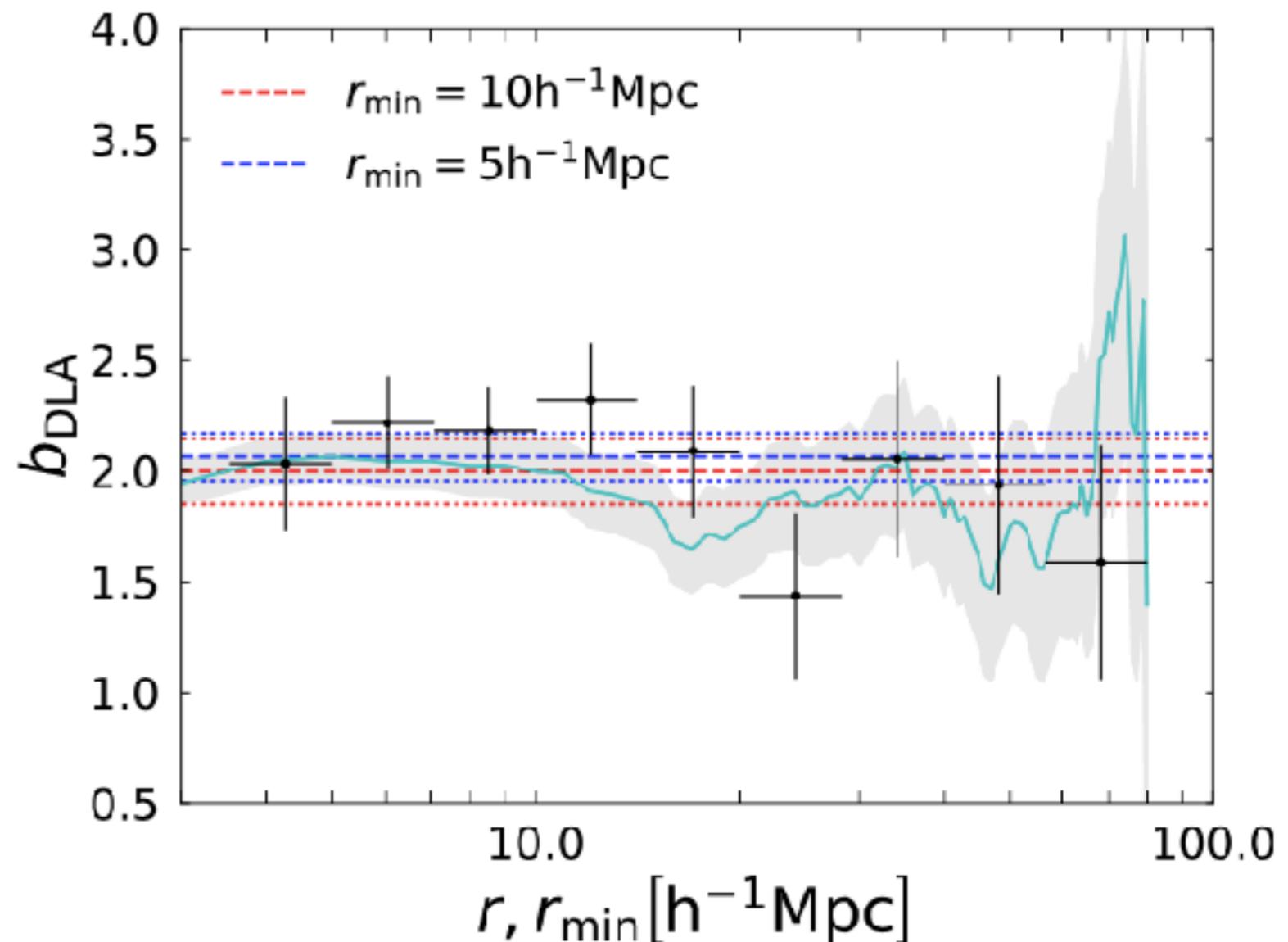
DLA-Lya cross-correlation

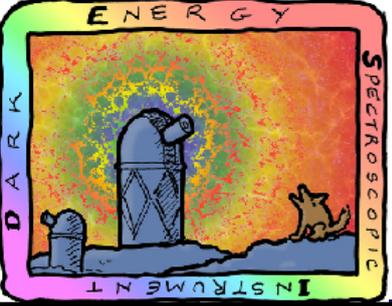


Ignasi Pérez-Ràfols
(moving from Barcelona
to Marseille)

Very relevant for
21 cm forecasts!

Pérez-Ràfols et al 2017
DLA bias from DR12
DLA-Lya cross

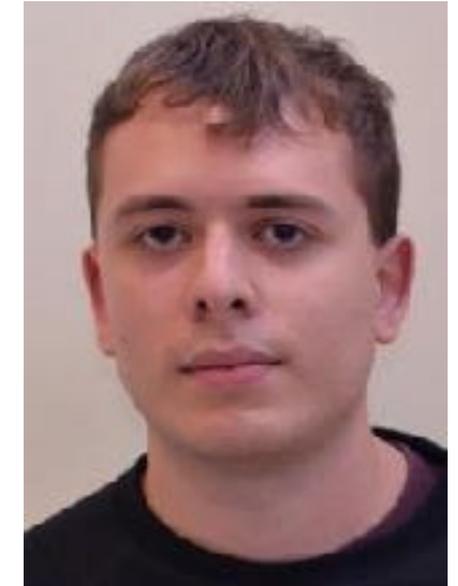




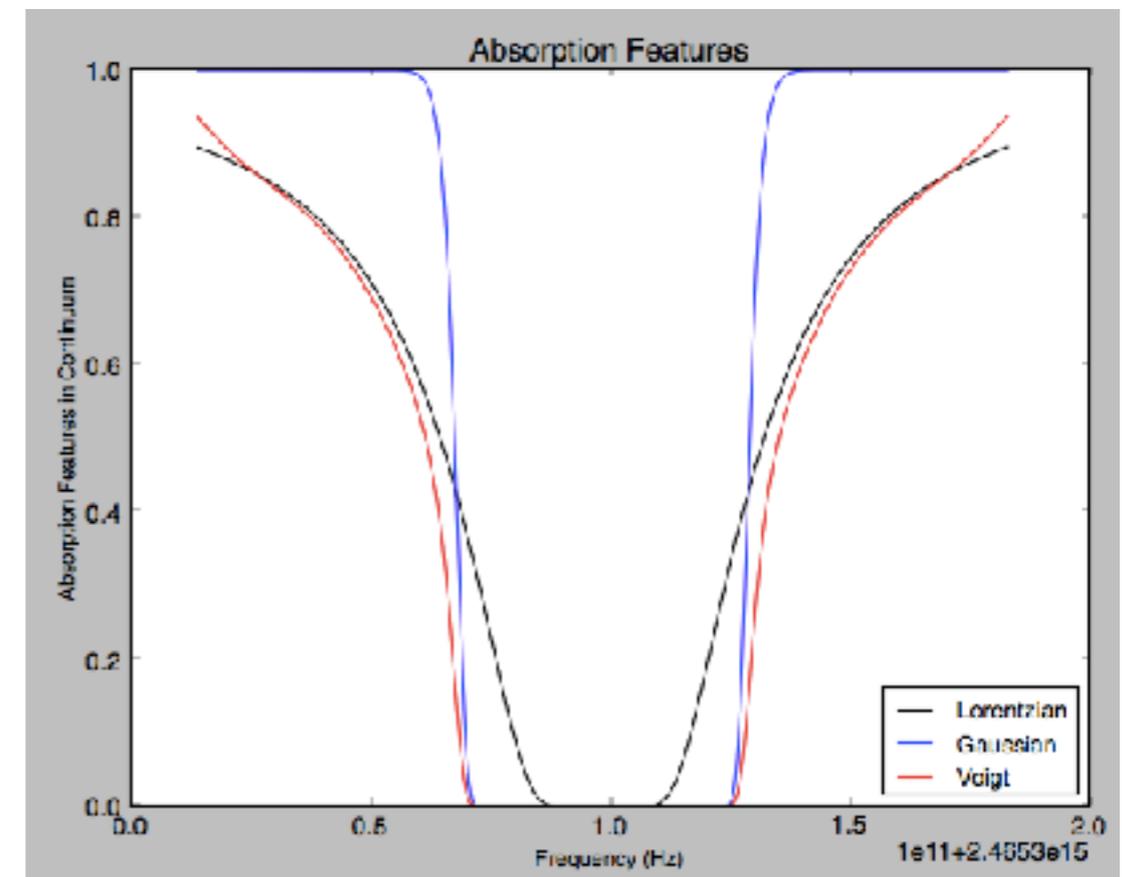
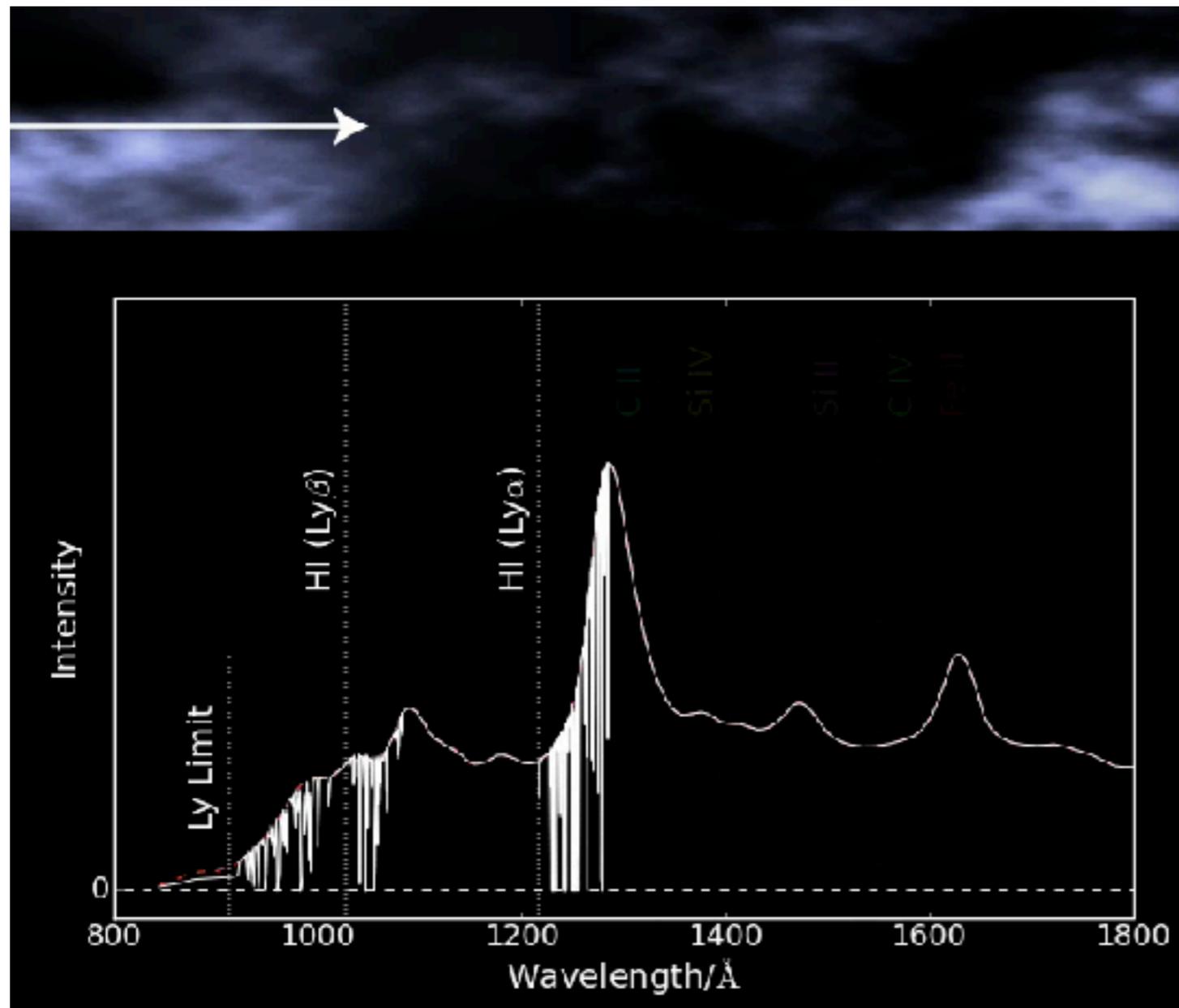
Contamination by high column densities

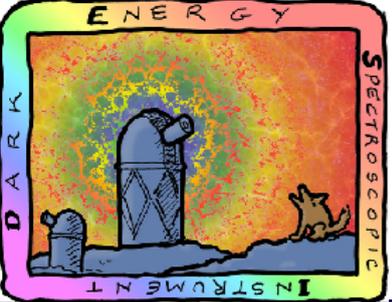


High column density (HCD) hydrogen absorbers are leading contaminants to the Lyman- α forest



Keir Rogers
(PhD @ UCL)
ID: 1711.06275
3D: 1706.08532





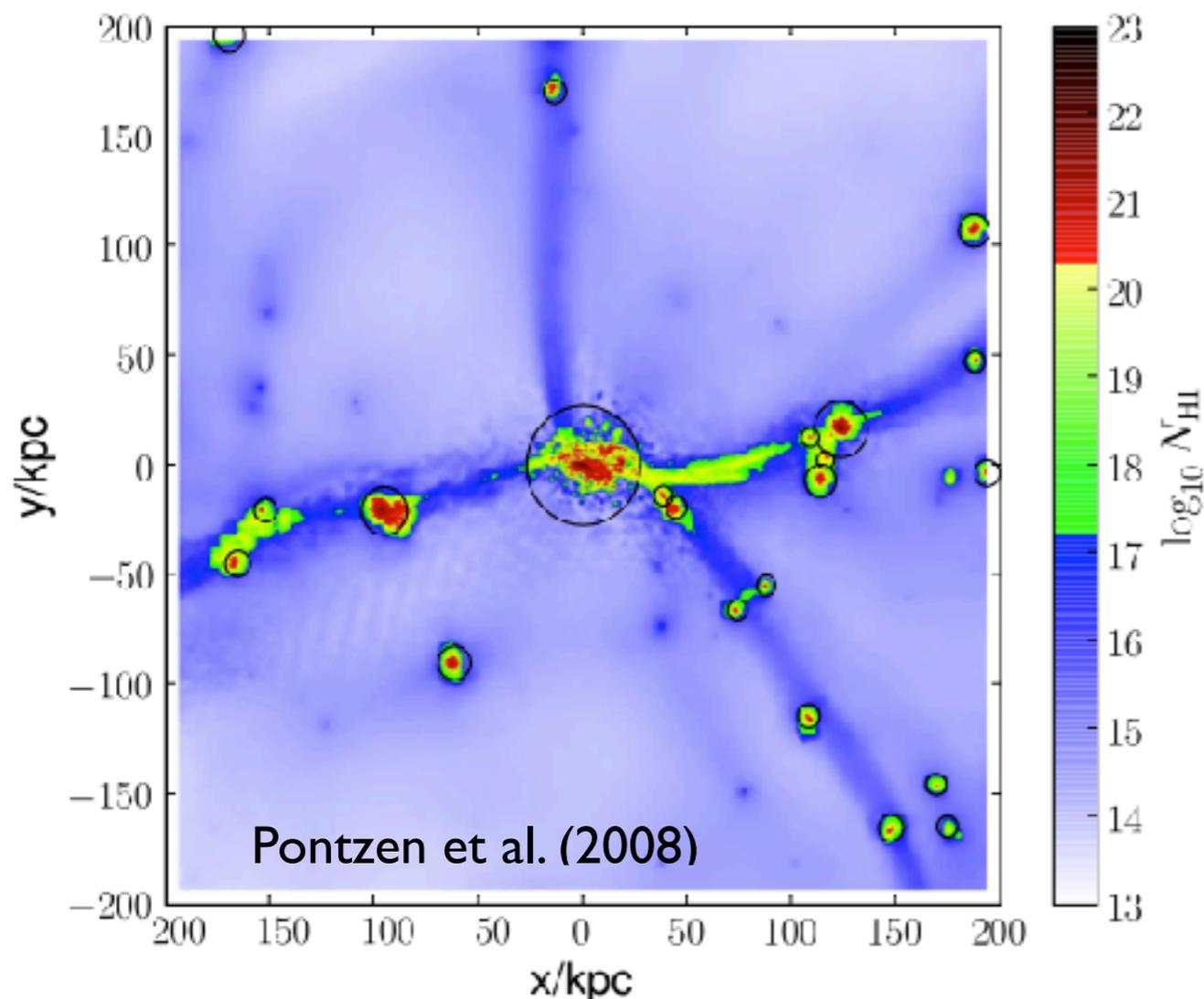
Contamination by high column densities



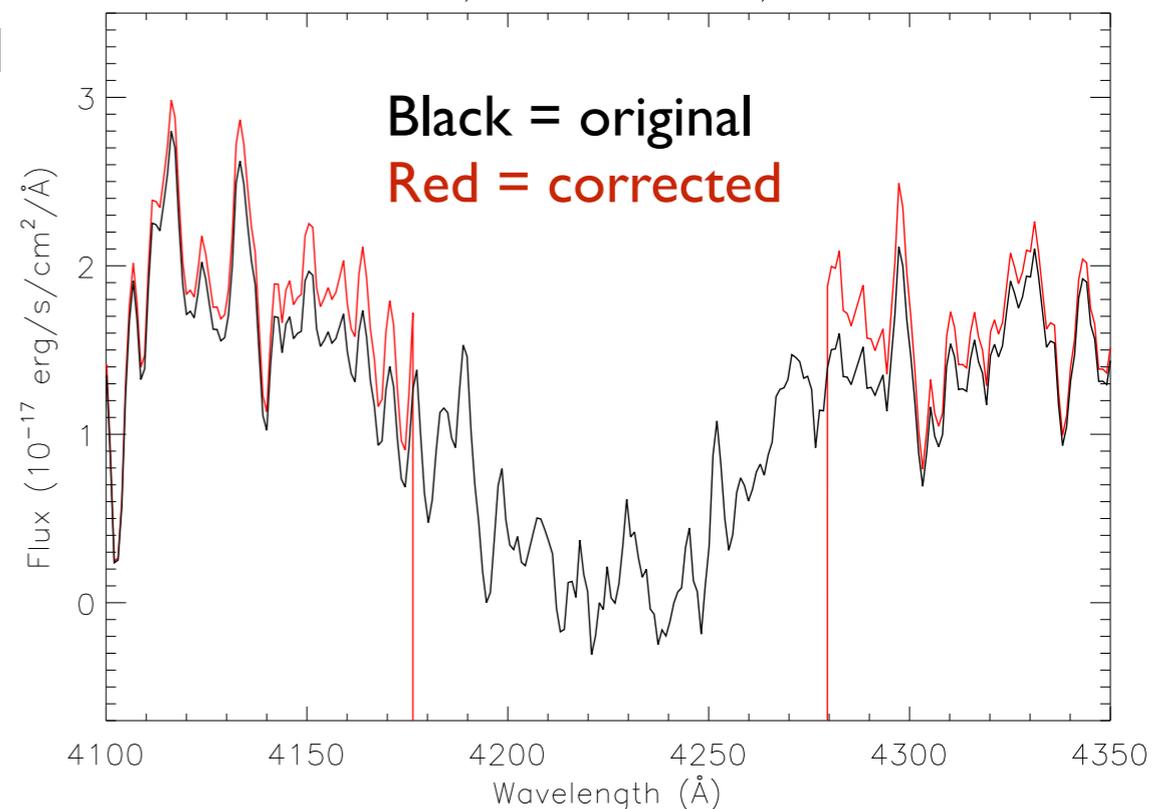
Lyman Limit System (LLS) are self-shielded against UV radiation

Damped Lyman- α (DLA) systems have Lorentzian tail

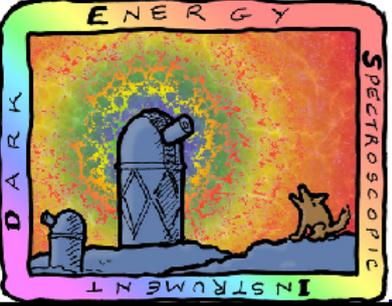
In BOSS we identified/masked the largest DLAs, but smaller systems were hidden in the noise



3587-55182-310; RA=8.975741, DEC=-0.231411



Absorber category	$N(\text{HI})_{\text{min}}$	$N(\text{HI})_{\text{max}}$
	[atoms cm^{-2}]	
Lyman-alpha forest	0	1.6×10^{17}
LLS	1.6×10^{17}	1×10^{19}
Sub-DLA	1×10^{19}	2×10^{20}
Small DLA	2×10^{20}	1×10^{21}
Large DLA	1×10^{21}	∞



Contamination by high column densities



Pure Ly- α model $P_{\text{Forest}}^{3\text{D}}(|\mathbf{k}|, \mu, z) = b_{\text{Forest}}^2 (1 + \beta_{\text{Forest}} \mu^2)^2 P_{\text{Linear}}^{3\text{D}}(|\mathbf{k}|, z) D_{\text{NL}}(|\mathbf{k}|, \mu)$

Consider absorption is caused by two tracers (Font-Ribera et al. 2012)

$$P_{\text{Contaminated}}^{3\text{D}}(|\mathbf{k}|, \mu, z) = P_{\text{Linear}}^{3\text{D}}(|\mathbf{k}|, z) [\tilde{b}_{\text{Forest}}^2 D_{\text{NL}}(|\mathbf{k}|, \mu) + 2\tilde{b}_{\text{Forest}} \tilde{b}_{\text{HCD}} + \tilde{b}_{\text{HCD}}^2]$$

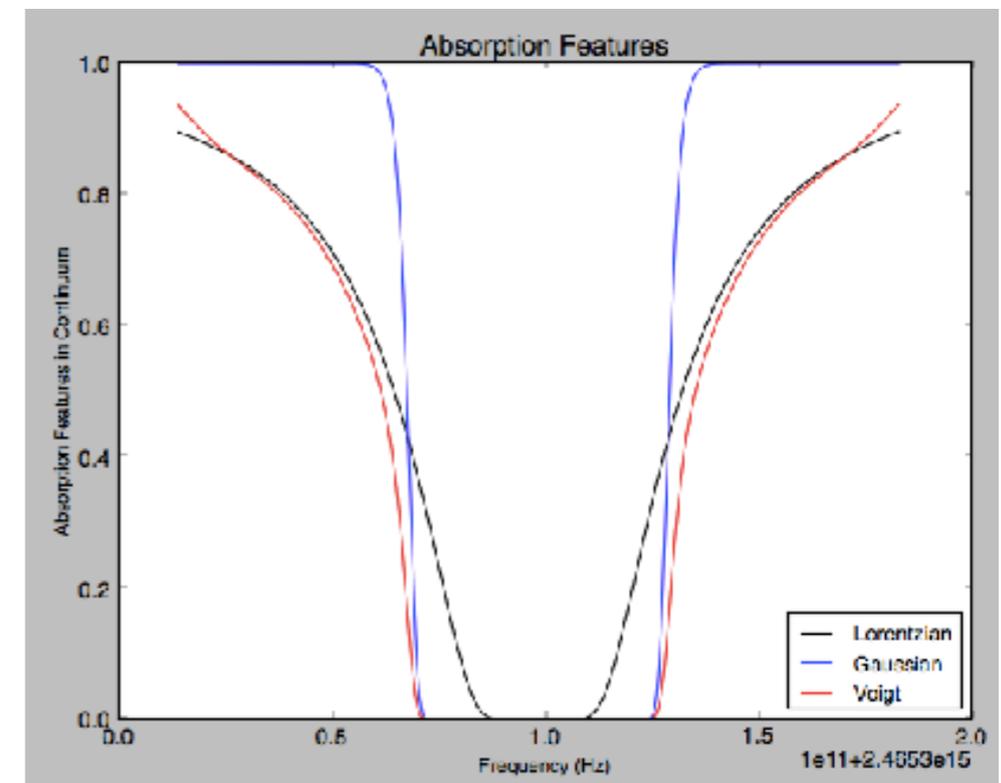
$$\tilde{b}_{\text{Forest}} = b_{\text{Forest}} (1 + \beta_{\text{Forest}} \mu^2) \quad \tilde{b}_{\text{HCD}} = b_{\text{HCD}} (1 + \beta_{\text{HCD}} \mu^2) F_{\text{HCD}}(k_{\parallel}, z)$$

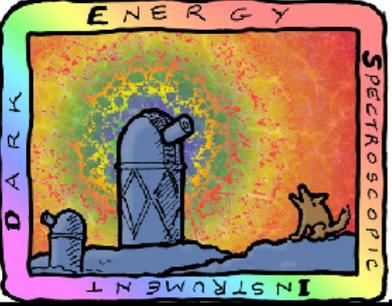
Model used in BOSS DR12: top-hat absorption

$$F_{\text{HCD}}^{\text{BOSS}}(k_{\parallel}, z) = \frac{\sin(L_{\text{HCD}} k_{\parallel})}{L_{\text{HCD}} k_{\parallel}},$$

Rogers et al. (2018): use FT of Voigt profile

$$F_{\text{HCD}}^{\text{Voigt}}(k_{\parallel}, z) = \int_{N(\text{HI})_{\text{min}}}^{N(\text{HI})_{\text{max}}} dN(\text{HI}) f(N(\text{HI}), z) V(k_{\parallel}, N(\text{HI})).$$

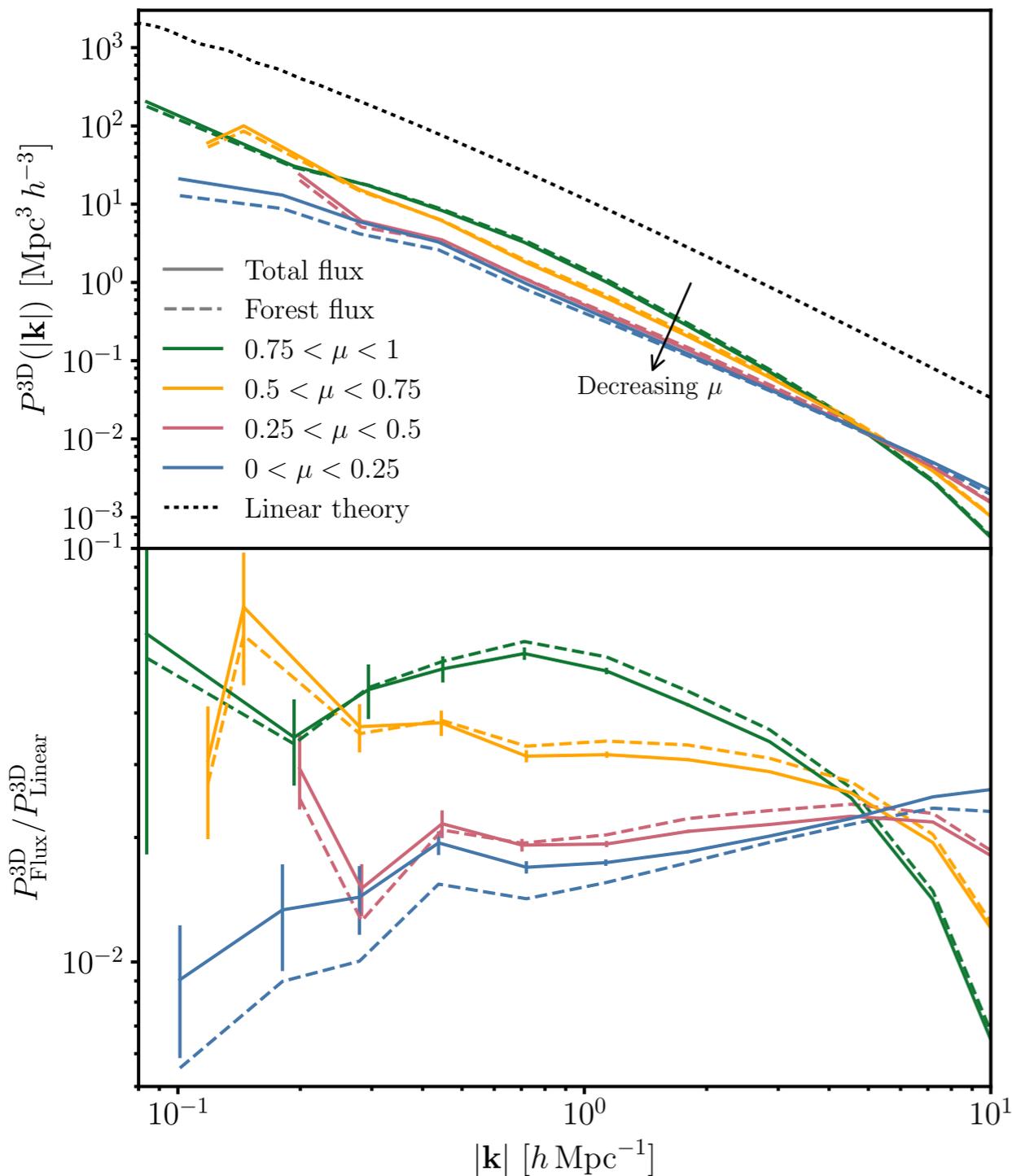




Contamination by high column densities



Total power as measured in Illustris



Fractional effect as measured in Illustris

