

planck

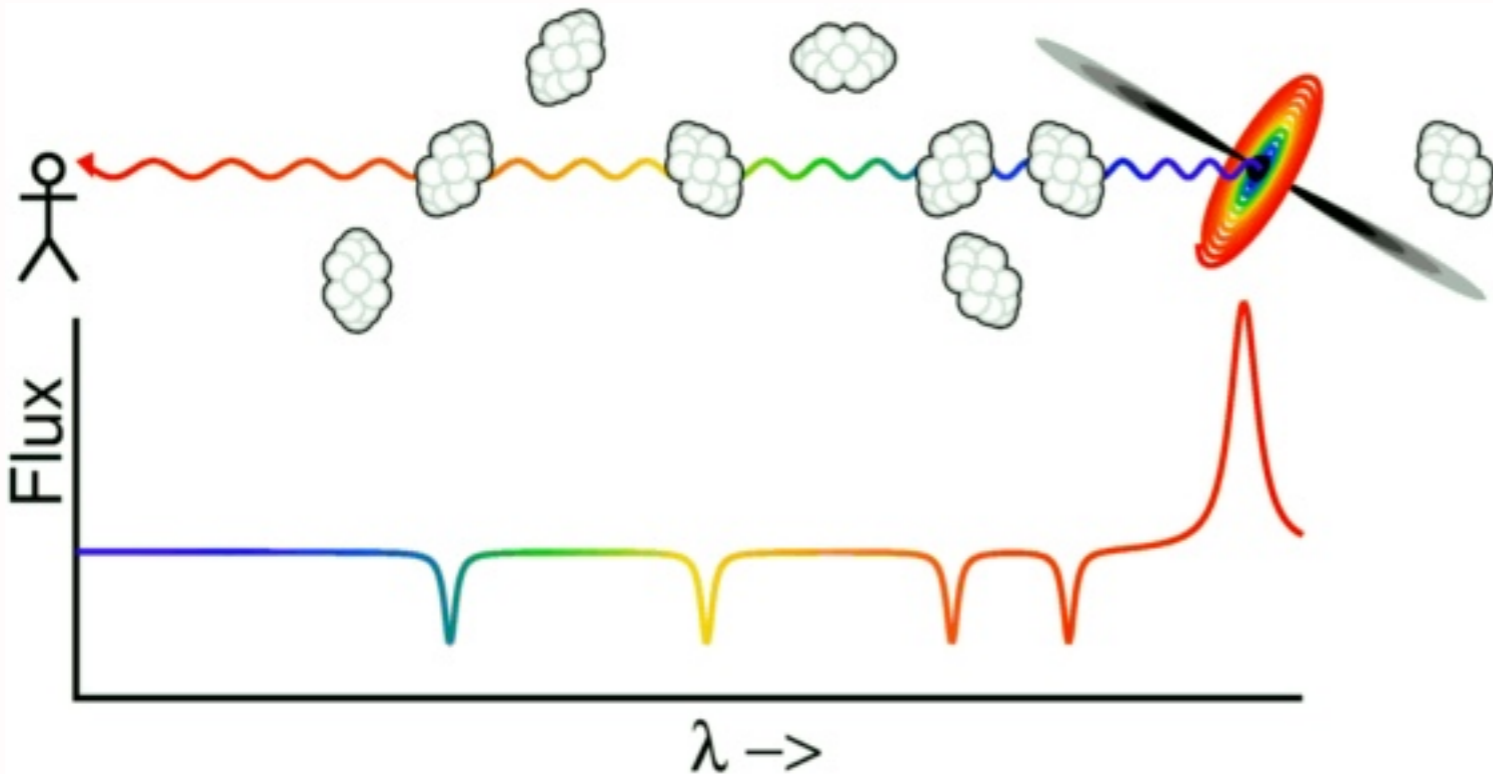
# Quasar spectra and Cosmology



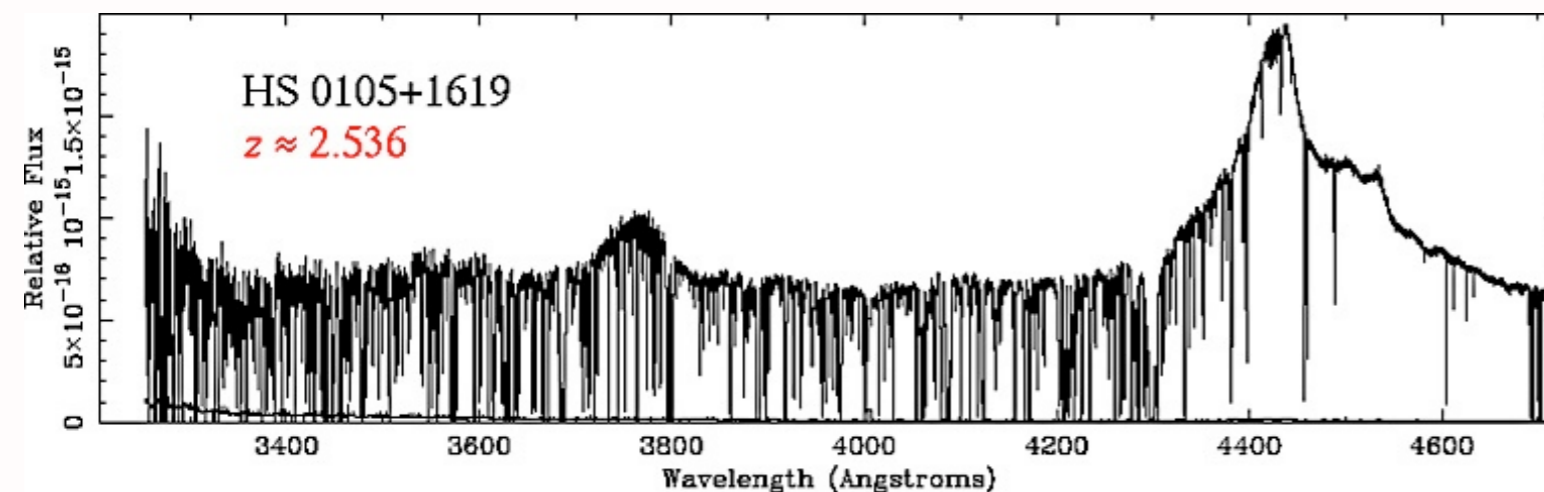
sdss/boss

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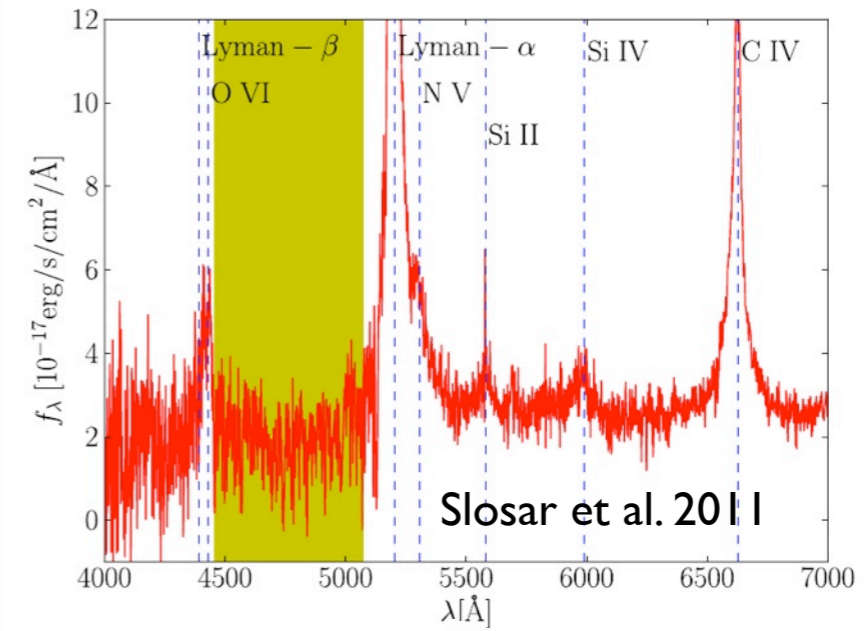
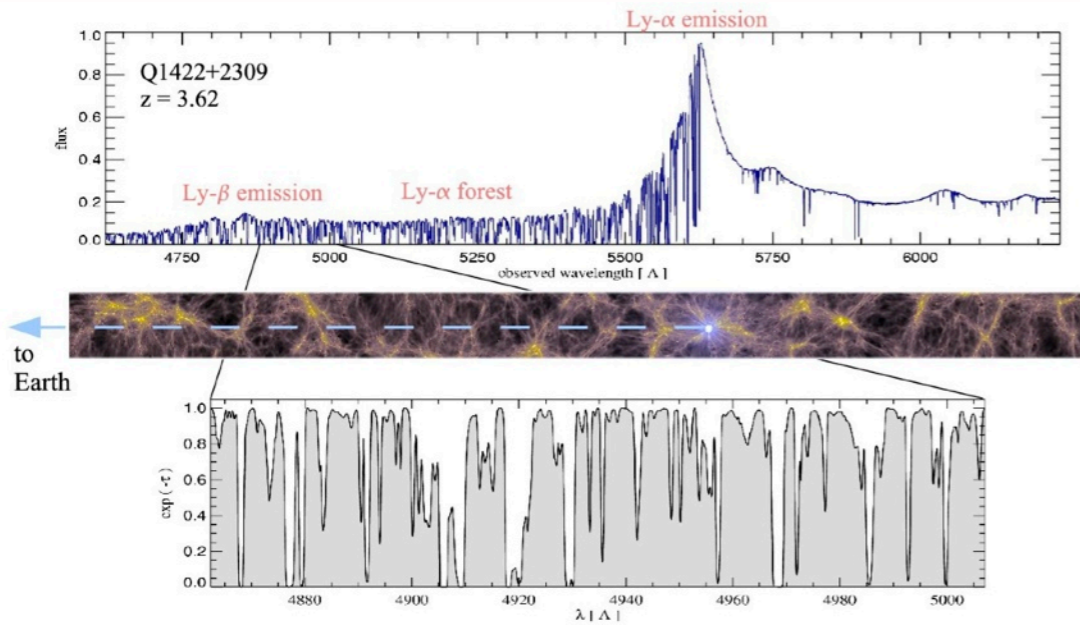
# Lyman alpha forest



- Quasars emit featureless spectrum with a few broad emissions
- Neutral hydrogen absorbs light at its rest-frame Ly-A
- HI traces gas, which traces dark matter..
- Each “skewer” is a 1-D map of density

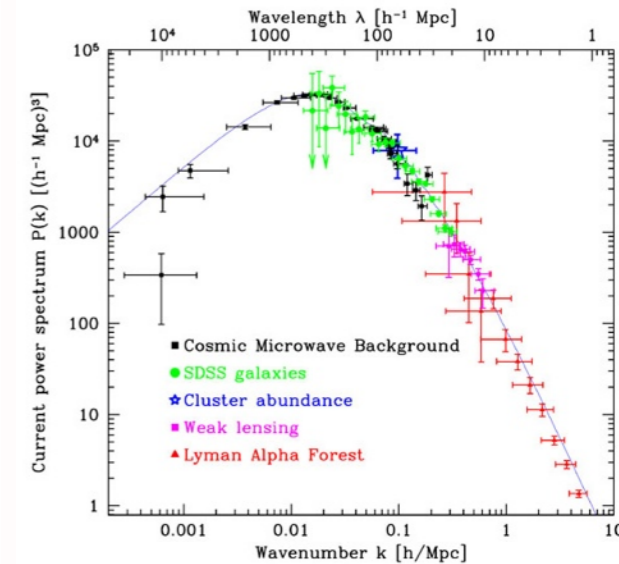
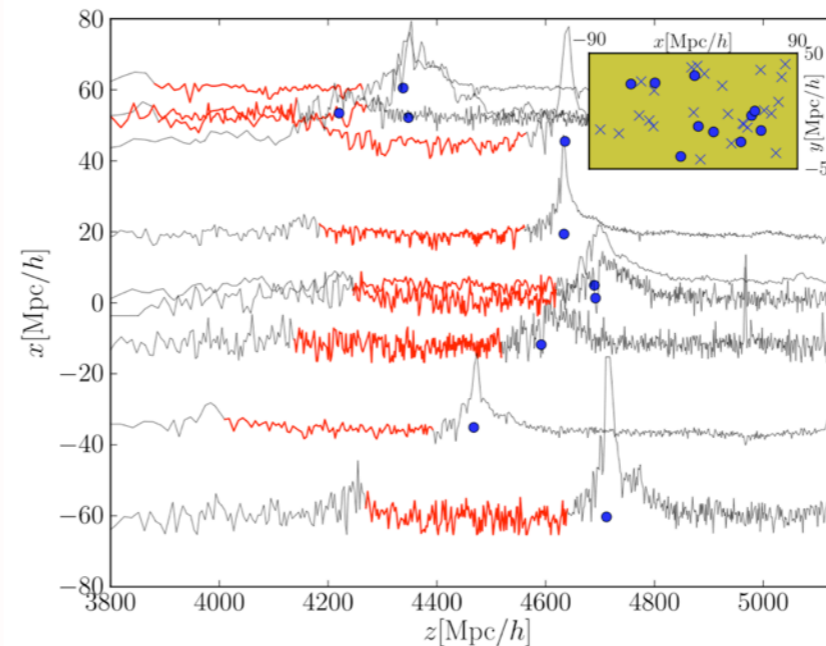
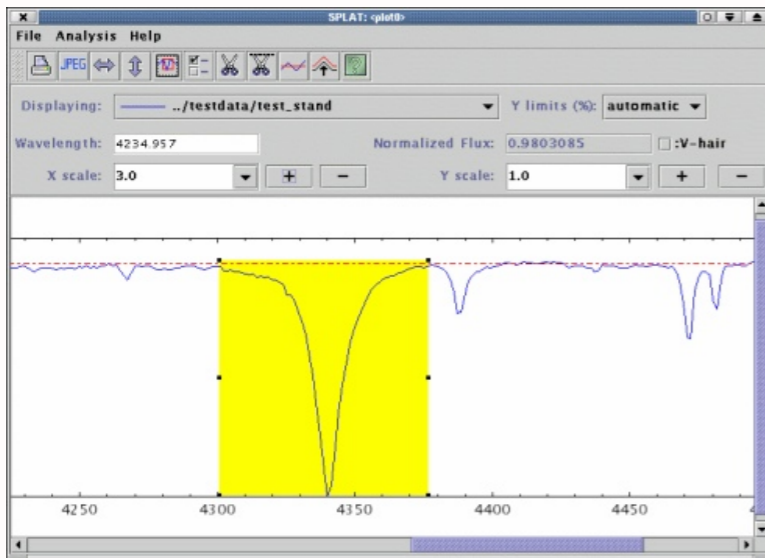


# Lines Physics



line fitting

n-point distribution

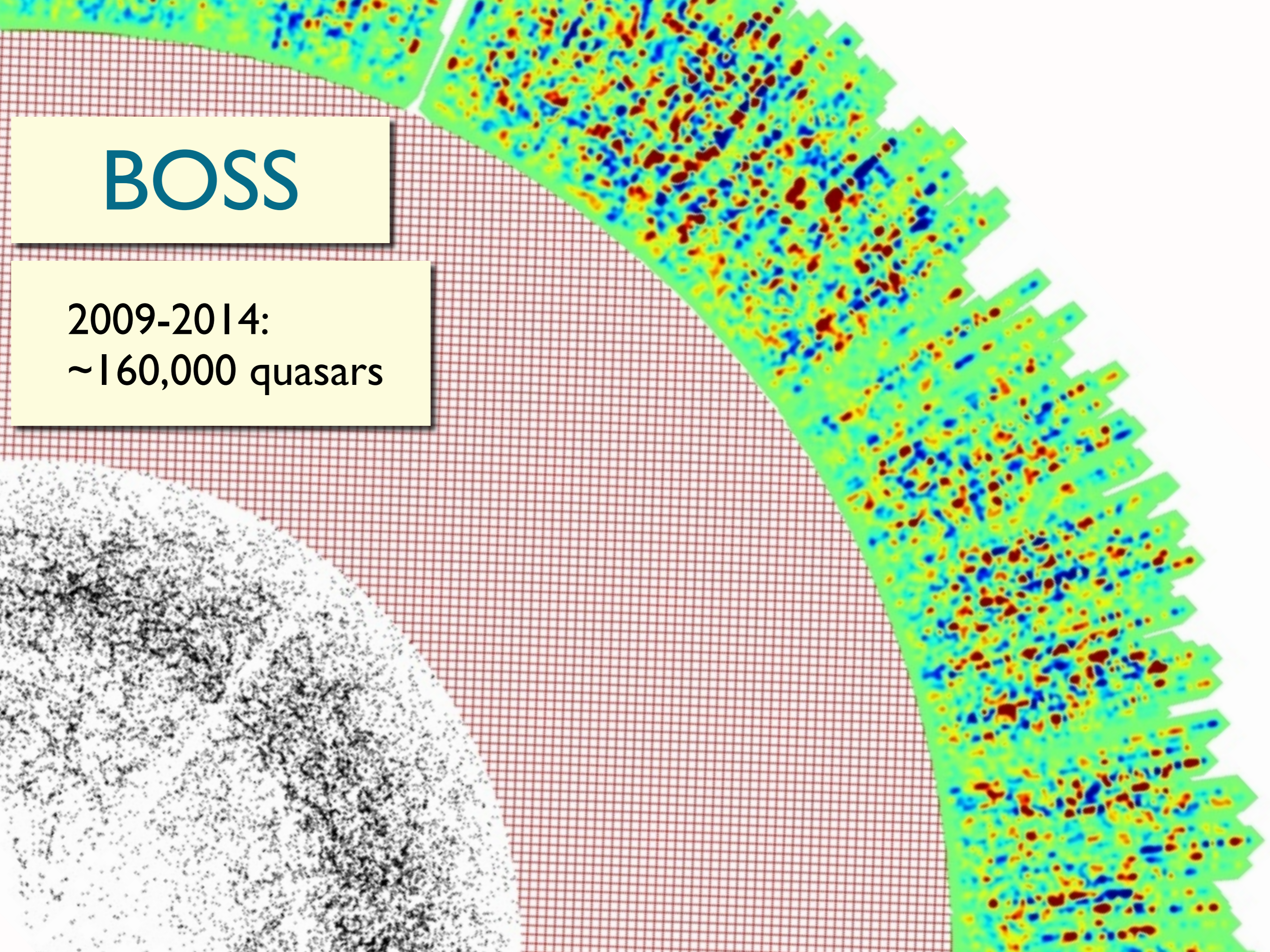


# Observables

| Statistic                      | Symbol                    | Measurements   |
|--------------------------------|---------------------------|--|
| Mean flux                      | $\langle F \rangle$       | Bernardi et al. 2003, Faucher-Giguere et al. 2008, Becker et al. 2013, ... |
| Flux PDF                       | $P(F)$                    | Rauch et al. 1997, McDonald et al. 2000, Becker et al. 2007, Lee+ 2014...  |
| Flux 1D power                  | $P_{F,1D}(k_{\parallel})$ | Croft et al. 2002, McDonald et al. 2006, Palanque-Delabrouille et al. 2013 |
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| Column density distribution    | $f(N_{\text{HI}})$        | Tytler 1987, Janknecht et al. 2011, ...                                    |
| Doppler parameter distribution | $f(b)$                    | Carswell et al. 1991, Lu et al. 1996, Kirkman and Tytler 1997, ...         |

# BOSS

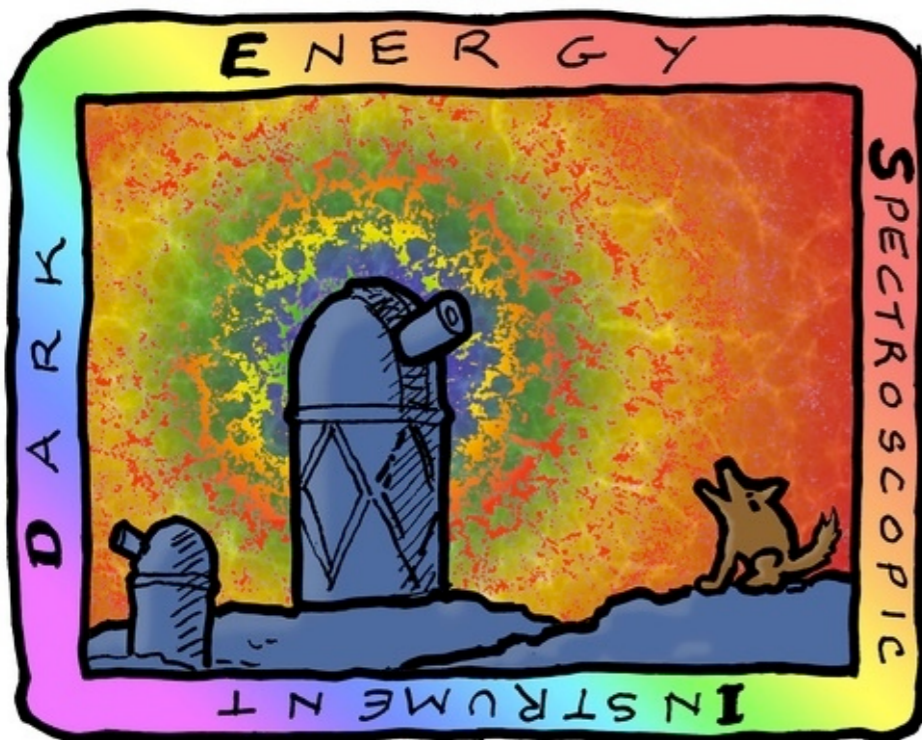
2009-2014:  
~160,000 quasars



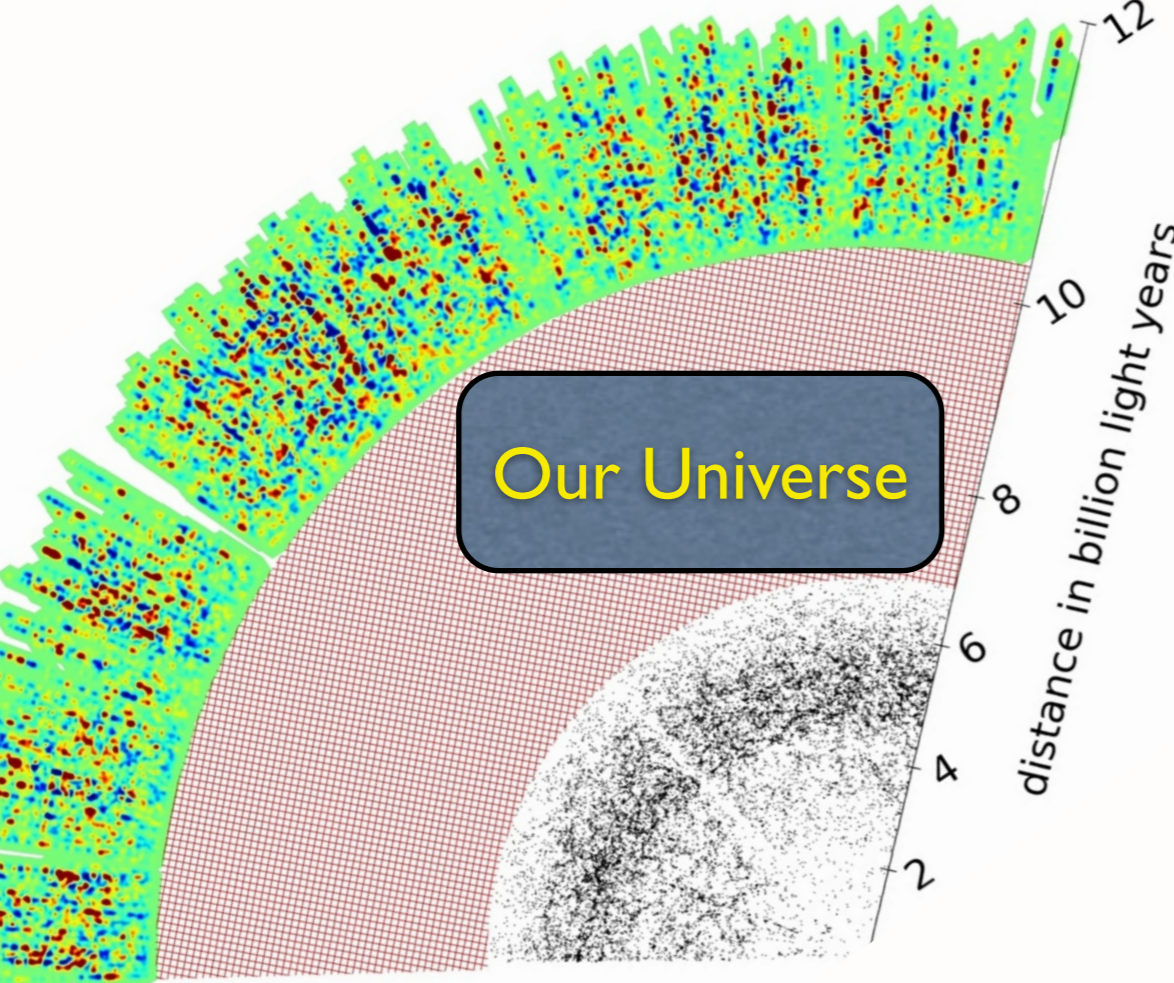
# Beyond BOSS



- eBOSS (SDSS-IV): 2014 - 2020
- adds ~50k new quasars
  - re-observes ~60k faint quasars

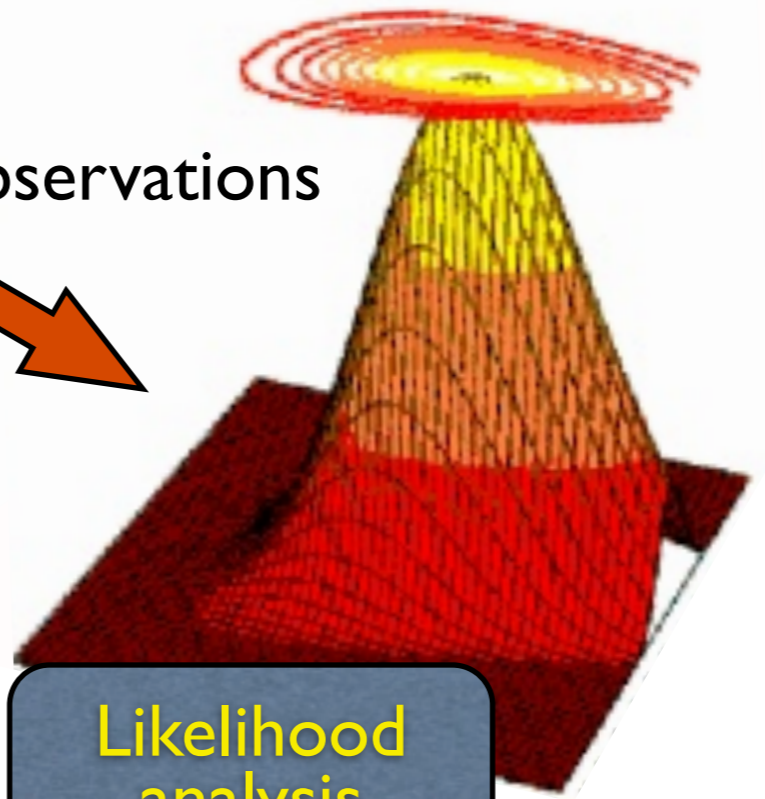


- DESI: 2018+
- 4m Mayal telescope
  - total ~600,000 quasars at  $z > 2$



Our Universe

Observations

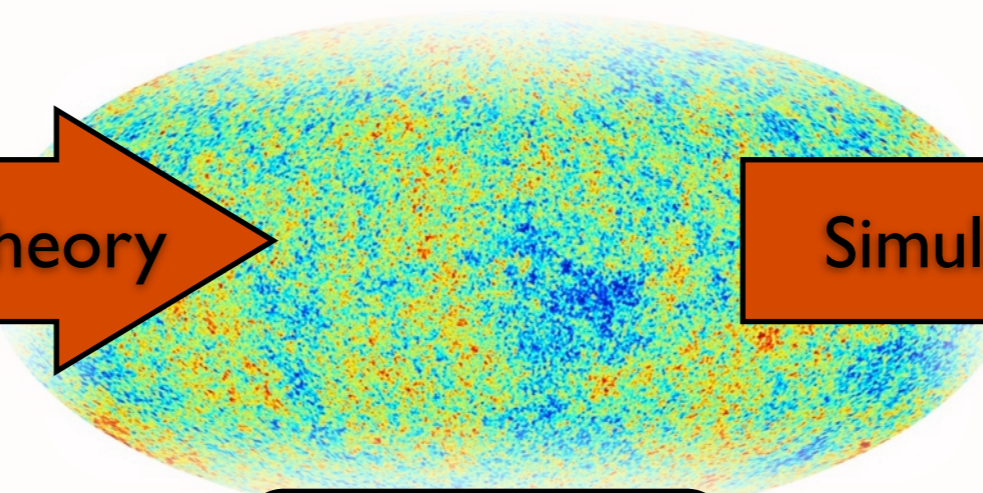


Likelihood analysis

Theoretical predictions

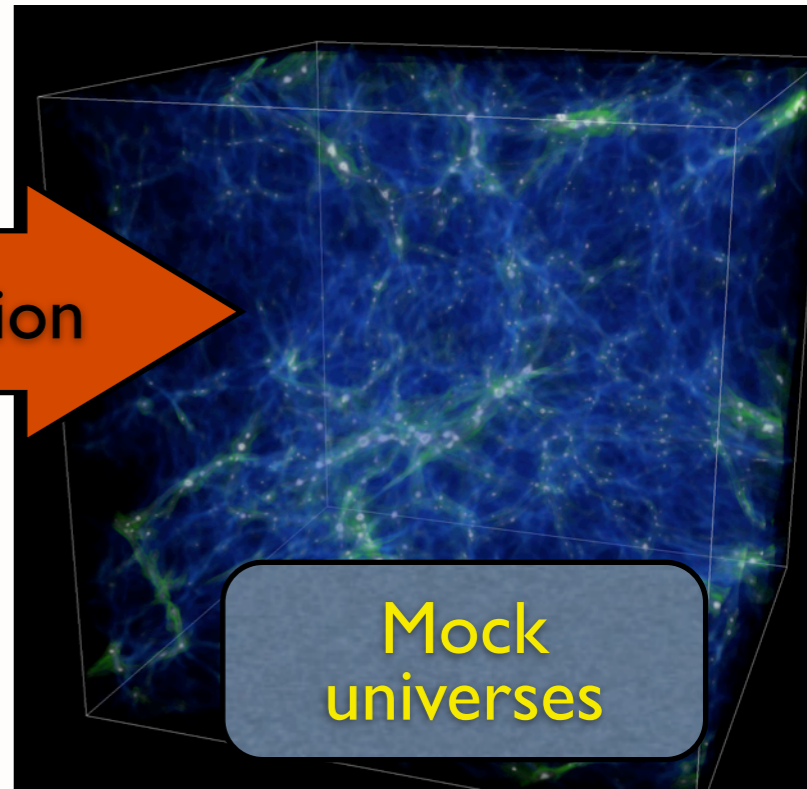
$\psi(x) = \frac{1}{\sqrt{2\pi}} e^{-\frac{x^2}{2\sigma^2}}$   
 $\langle x \rangle = \int_{-\infty}^{\infty} x \psi(x) dx = 0$   
 $\langle x^2 \rangle = \int_{-\infty}^{\infty} x^2 \psi(x) dx = \sigma^2$   
 $\langle x^n \rangle = 0$  for odd  $n$   
 $\langle x^n \rangle = \frac{n-1}{2} \sigma^2 \langle x^{n-2} \rangle$  for even  $n$   
 $\langle x^4 \rangle = 3\sigma^4$   
 $\langle x^6 \rangle = 15\sigma^6$   
 $\langle x^8 \rangle = 105\sigma^8$   
 $\langle x^{10} \rangle = 945\sigma^{10}$   
 $\langle x^{12} \rangle = 10395\sigma^{12}$   
 $\langle x^{14} \rangle = 135135\sigma^{14}$   
 $\langle x^{16} \rangle = 2018709\sigma^{16}$   
 $\langle x^{18} \rangle = 35271615\sigma^{18}$   
 $\langle x^{20} \rangle = 675177735\sigma^{20}$   
 $\langle x^{22} \rangle = 1351351470\sigma^{22}$   
 $\langle x^{24} \rangle = 2874309095\sigma^{24}$   
 $\langle x^{26} \rangle = 6012018195\sigma^{26}$   
 $\langle x^{28} \rangle = 12424137605\sigma^{28}$   
 $\langle x^{30} \rangle = 25848275205\sigma^{30}$   
 $\langle x^{32} \rangle = 53140973405\sigma^{32}$   
 $\langle x^{34} \rangle = 110185947005\sigma^{34}$   
 $\langle x^{36} \rangle = 228391894005\sigma^{36}$   
 $\langle x^{38} \rangle = 470413027005\sigma^{38}$   
 $\langle x^{40} \rangle = 970826054005\sigma^{40}$   
 $\langle x^{42} \rangle = 2000000000000\sigma^{42}$   
 $\langle x^{44} \rangle = 4100000000000\sigma^{44}$   
 $\langle x^{46} \rangle = 8400000000000\sigma^{46}$   
 $\langle x^{48} \rangle = 17000000000000\sigma^{48}$   
 $\langle x^{50} \rangle = 35000000000000\sigma^{50}$   
 $\langle x^{52} \rangle = 70000000000000\sigma^{52}$   
 $\langle x^{54} \rangle = 140000000000000\sigma^{54}$   
 $\langle x^{56} \rangle = 280000000000000\sigma^{56}$   
 $\langle x^{58} \rangle = 560000000000000\sigma^{58}$   
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 $\langle x^{82} \rangle = 2293760000000000000\sigma^{82}$   
 $\langle x^{84} \rangle = 4587520000000000000\sigma^{84}$   
 $\langle x^{86} \rangle = 9175040000000000000\sigma^{86}$   
 $\langle x^{88} \rangle = 18350080000000000000\sigma^{88}$   
 $\langle x^{90} \rangle = 36700160000000000000\sigma^{90}$   
 $\langle x^{92} \rangle = 73400320000000000000\sigma^{92}$   
 $\langle x^{94} \rangle = 146800640000000000000\sigma^{94}$   
 $\langle x^{96} \rangle = 293601280000000000000\sigma^{96}$   
 $\langle x^{98} \rangle = 587202560000000000000\sigma^{98}$   
 $\langle x^{100} \rangle = 1174405120000000000000\sigma^{100}$

Linear theory



Initial conditions

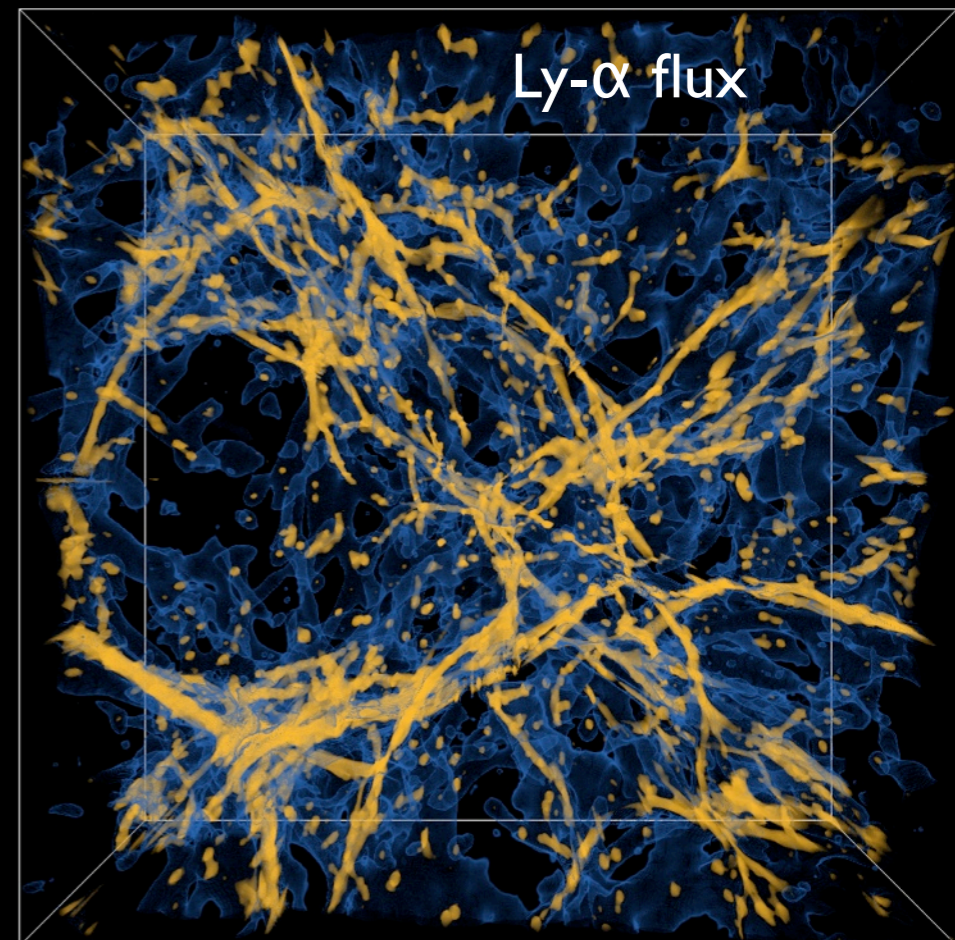
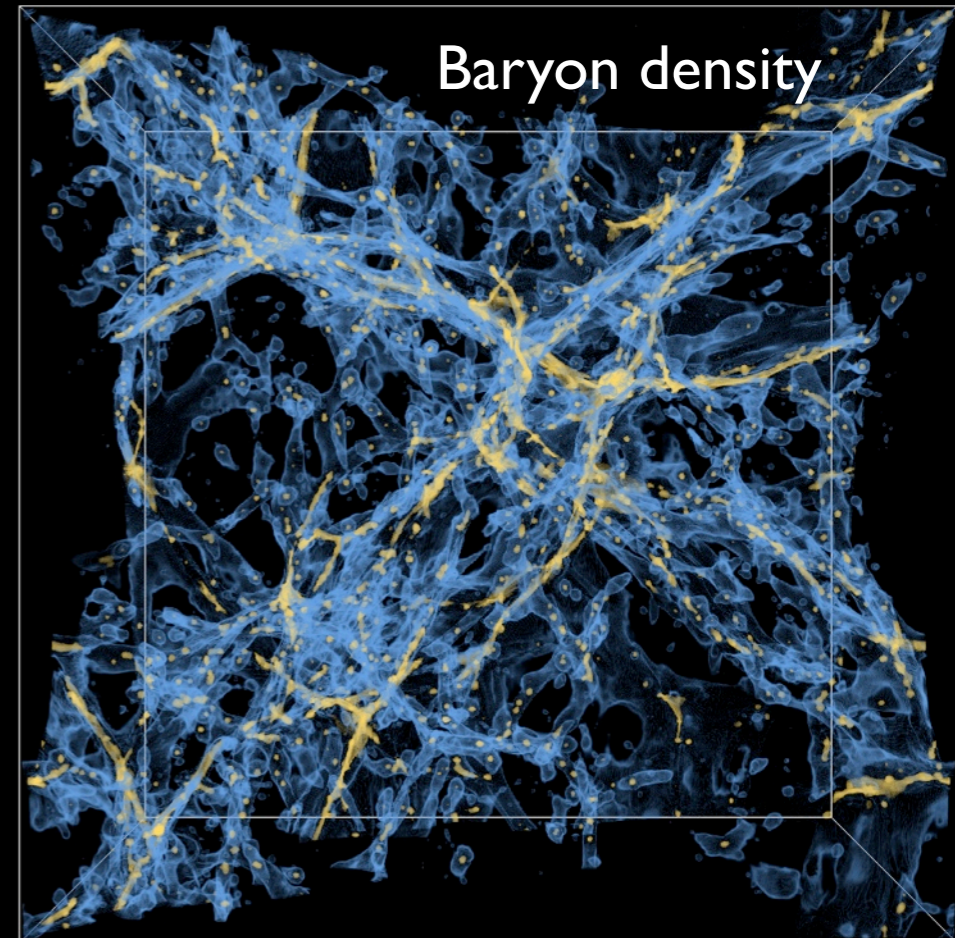
Simulation



Mock universes

# Nyx

- 3-D Cartesian grid, finite volume representation
- Evolve dark matter as collisionless Lagrangian fluid
- Evolve baryons as ideal gas using unsplit, Godunov-type methodology
- Adaptive mesh refinement (AMR) to extend dynamic range
- Uses BoxLib software framework developed at LBL
- Code paper: [ApJ, 765, 39 \(2013\)](#)





# Atomic species

- 2 primordial elements: H and He
- 6 ionic species:  $H_0$ ,  $H_+$ ,  $He_0$ ,  $He_+$ ,  $He_{++}$ ,  $e^-$

$$\frac{dn_{H_0}}{dt} = \alpha_{H_+}(T)n_{H_+}n_e - \Gamma_{eH_0}(T)n_en_{H_0} - \Gamma_{\gamma H_0}n_{H_0}$$

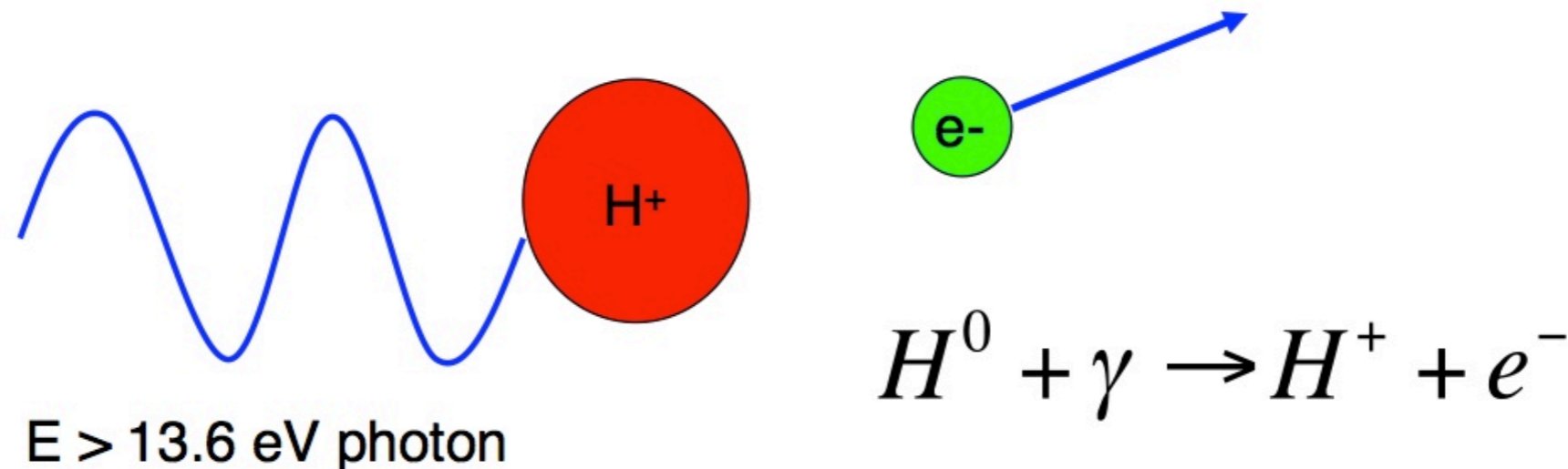
- Timescale on which species evolve:

$$t \sim \left| n \left( \frac{dn}{dt} \right)^{-1} \right| \sim \left| n_e (\alpha_{H_+}(T) - \Gamma_{eH_0}(T)) - \Gamma_{\gamma H_0} \right|^{-1}$$

For  $z \sim 2$ ,  $J(\nu) \sim \text{few} \times 10^{-22} \text{ erg s}^{-1} \text{ cm}^{-2} \text{ sr}^{-1} \text{ Hz}^{-1}$

$t \sim \text{few} \times 10^4 \text{ years}$

# Photo-heating



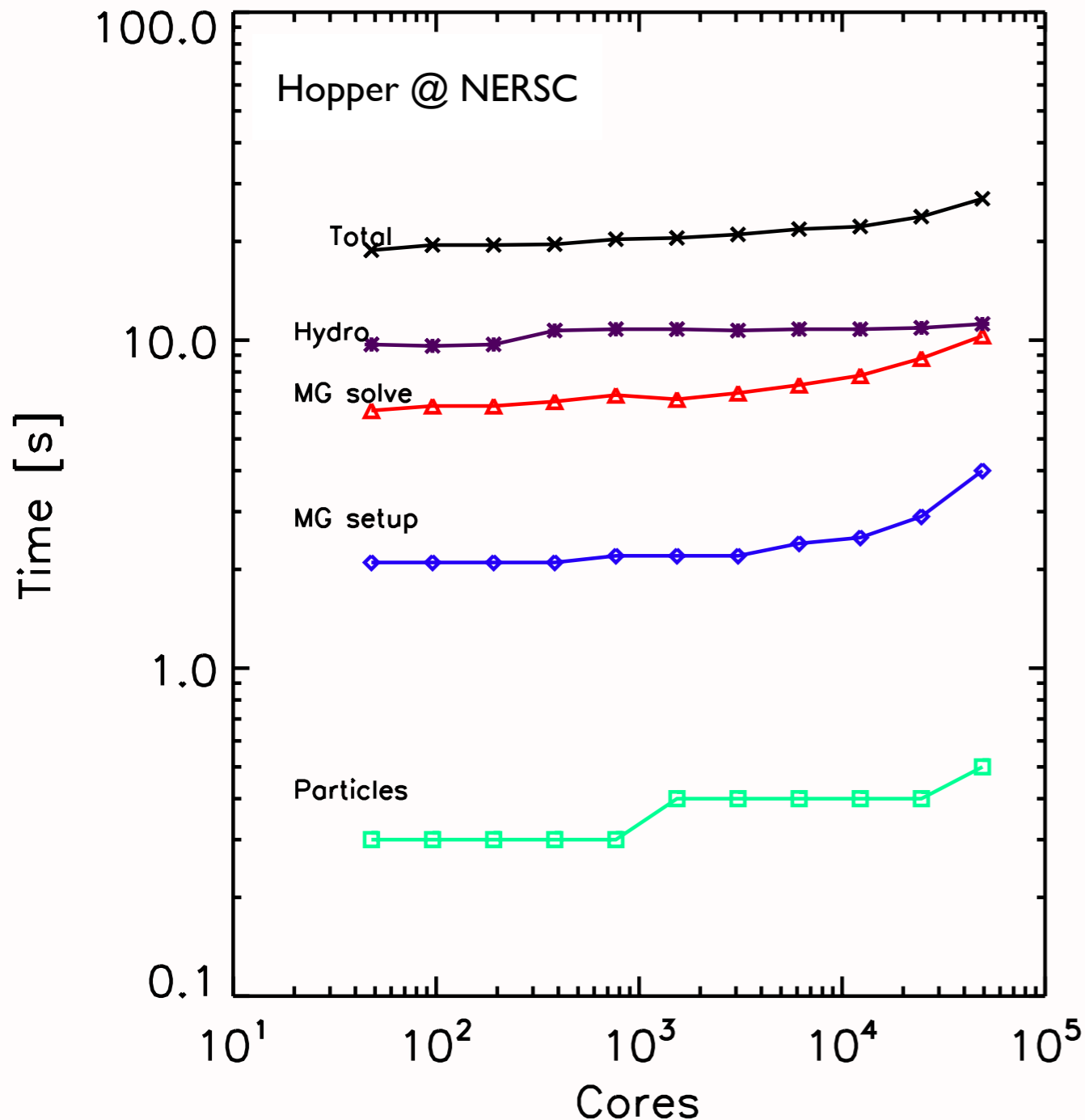
- Mean excess energy of ionizing photon for  $J_\nu \propto \nu^{-\beta}$  (Abel & Haehnelt 1999):

$$\langle E \rangle = \frac{h\nu_i}{\beta + 2}$$

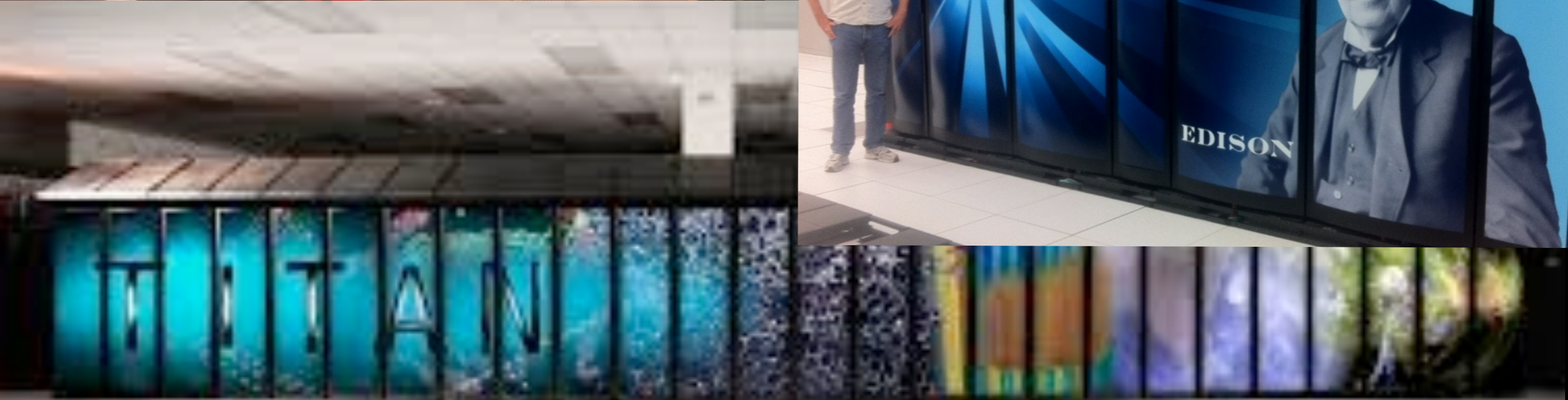
- Low density IGM in ionization equilibrium (Miralda-Escudé & Rees 1994):

$$\frac{dT}{dt} = \frac{2}{3k_B} \langle E \rangle \alpha(T) n - 2HT$$

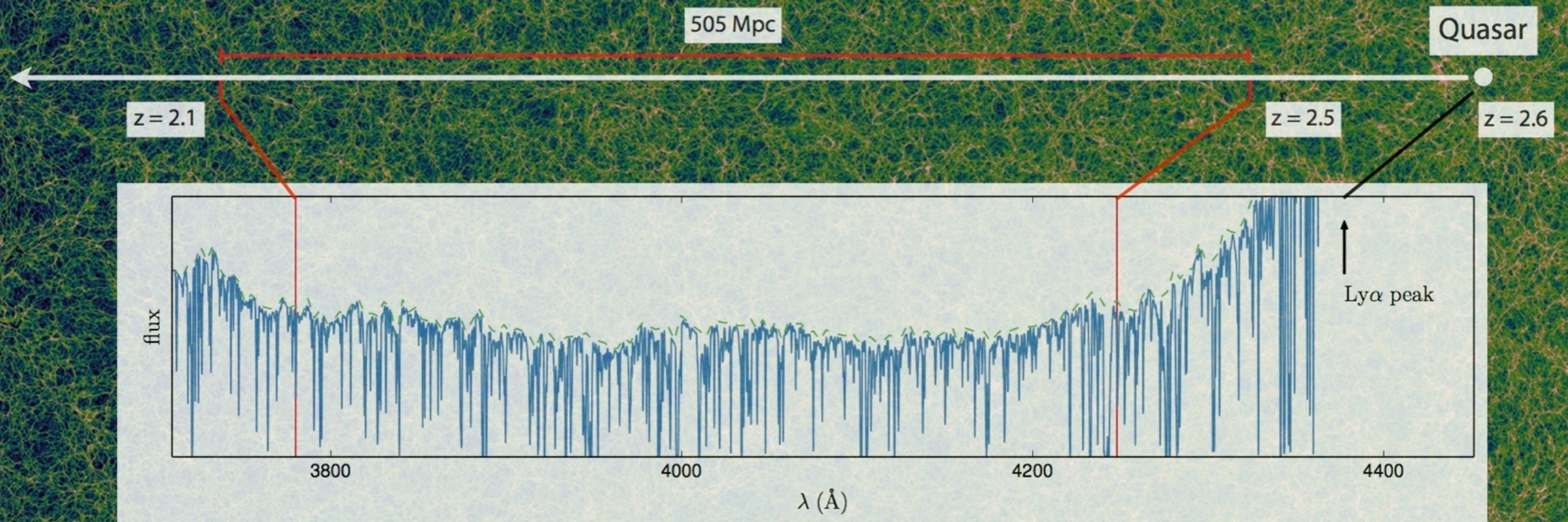
# Excellent scaling

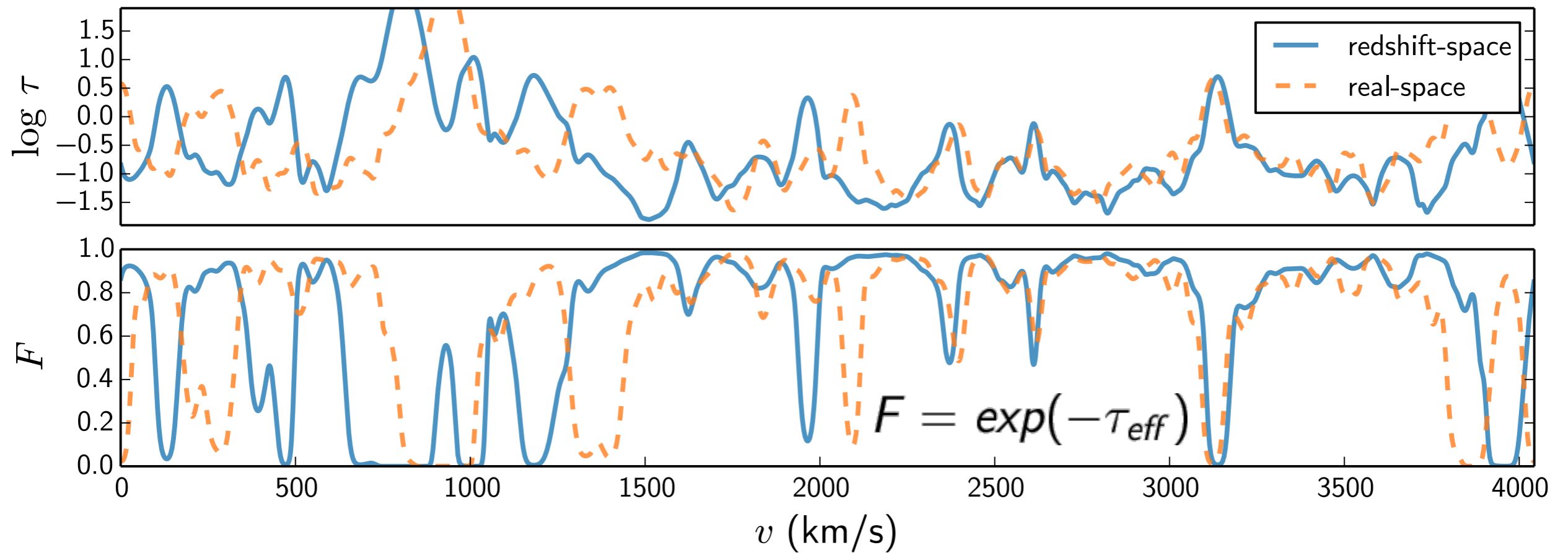
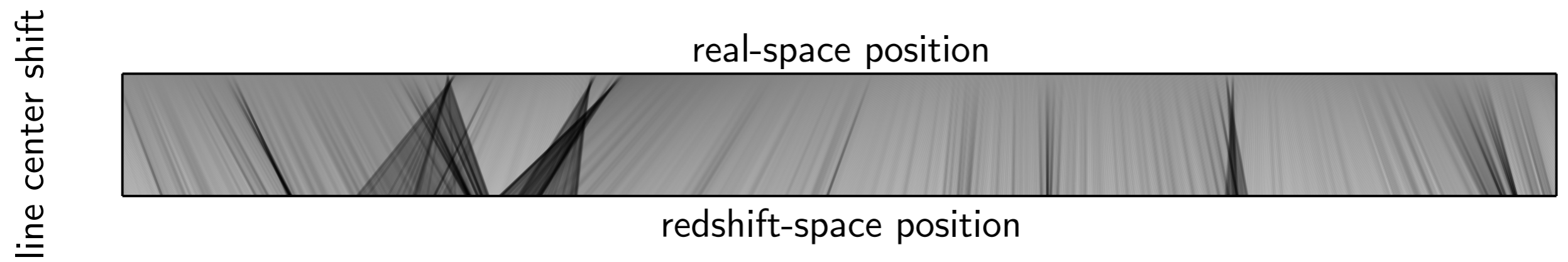
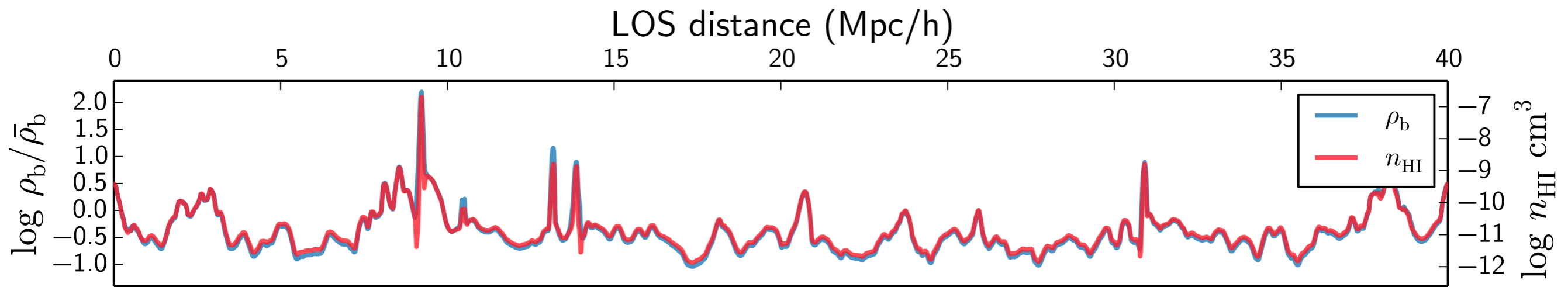


- Currently we are using NERSC resources under ALCC allocation.
- Mostly running  $4096^3$  simulations now.
- Hopper/Edison: standard cluster architecture, 24 cores on a node, 32/64GB per node, ~5,000 nodes.
- Analysis pipeline on par with simulations.

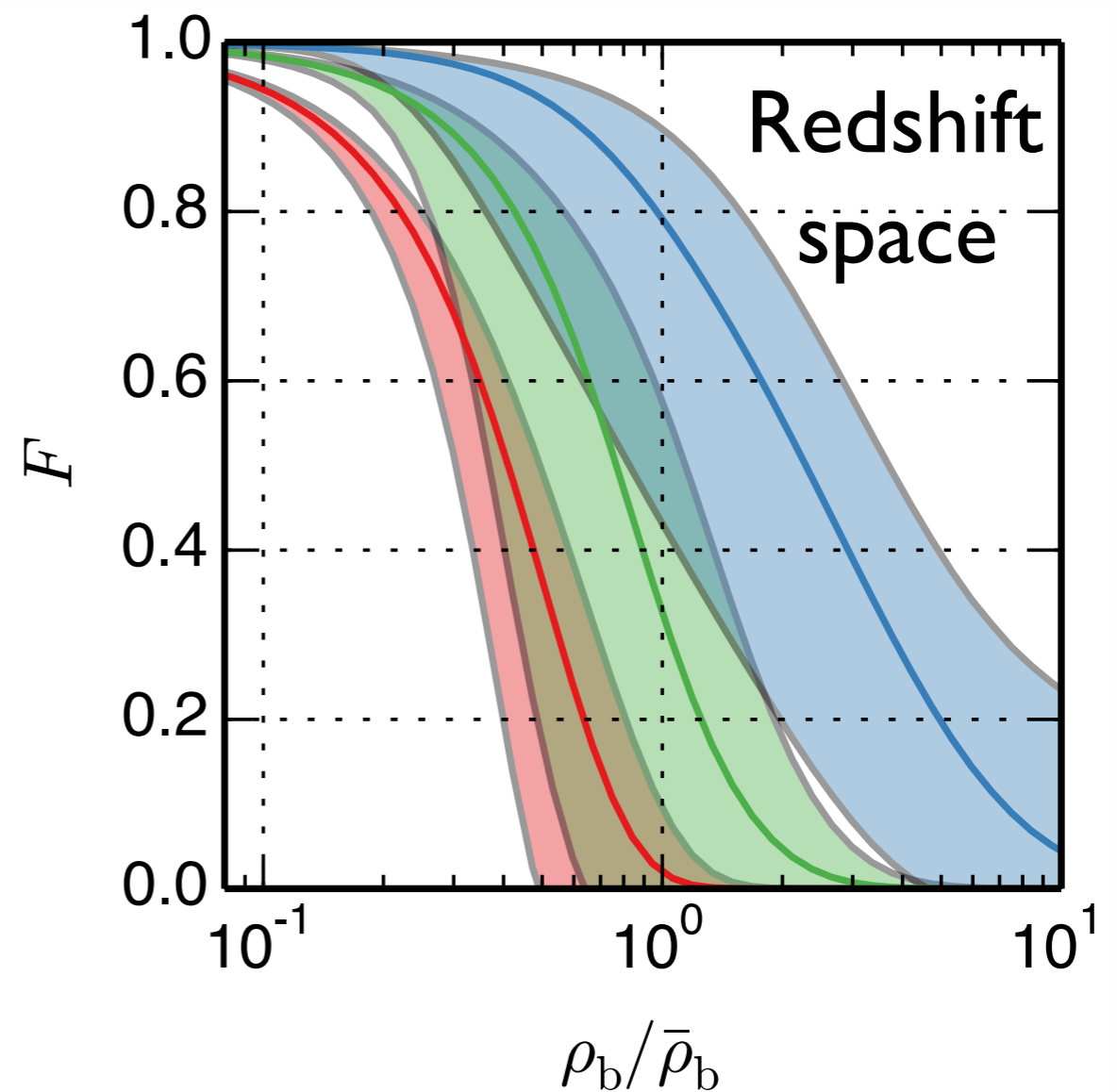
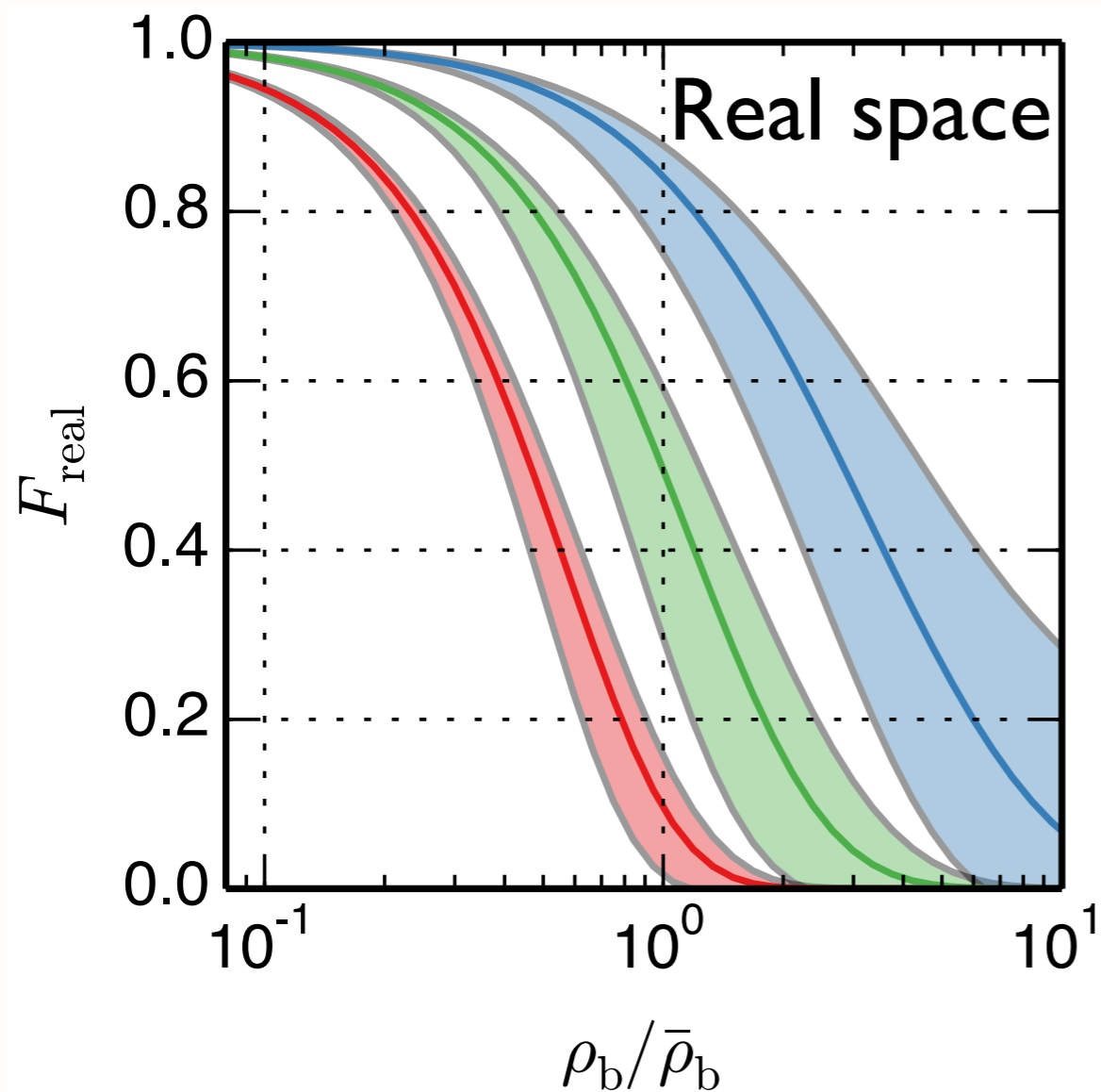
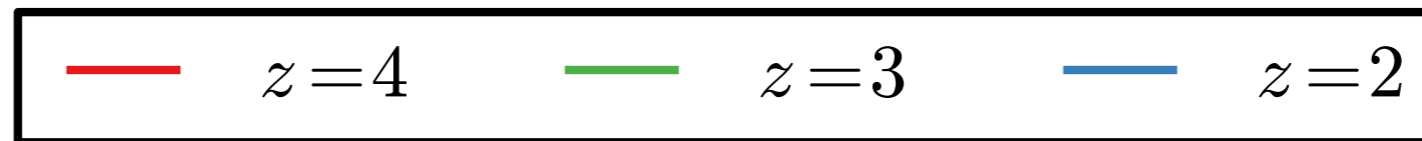


# The Lyman- $\alpha$ forest in optically-thin hydro simulations

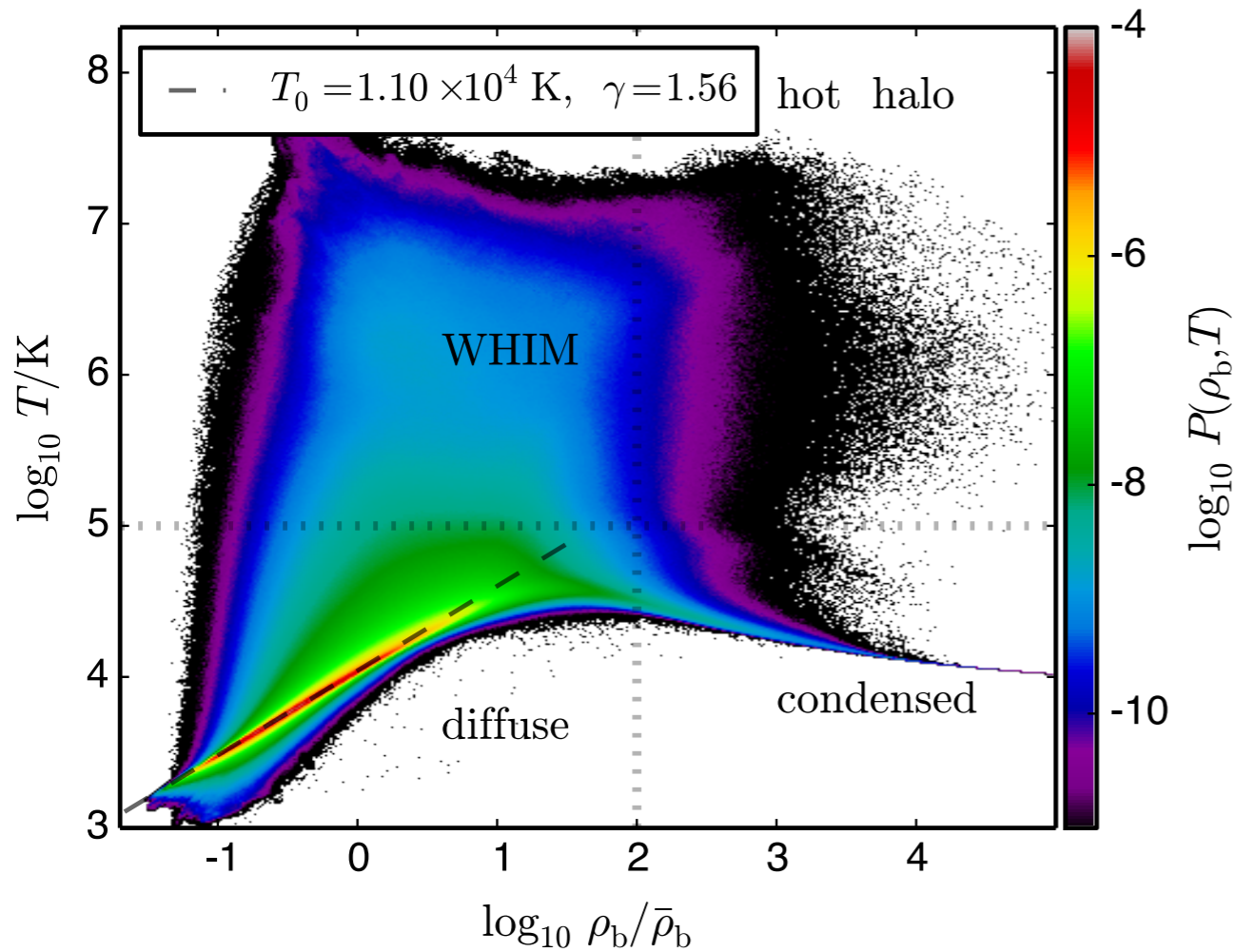




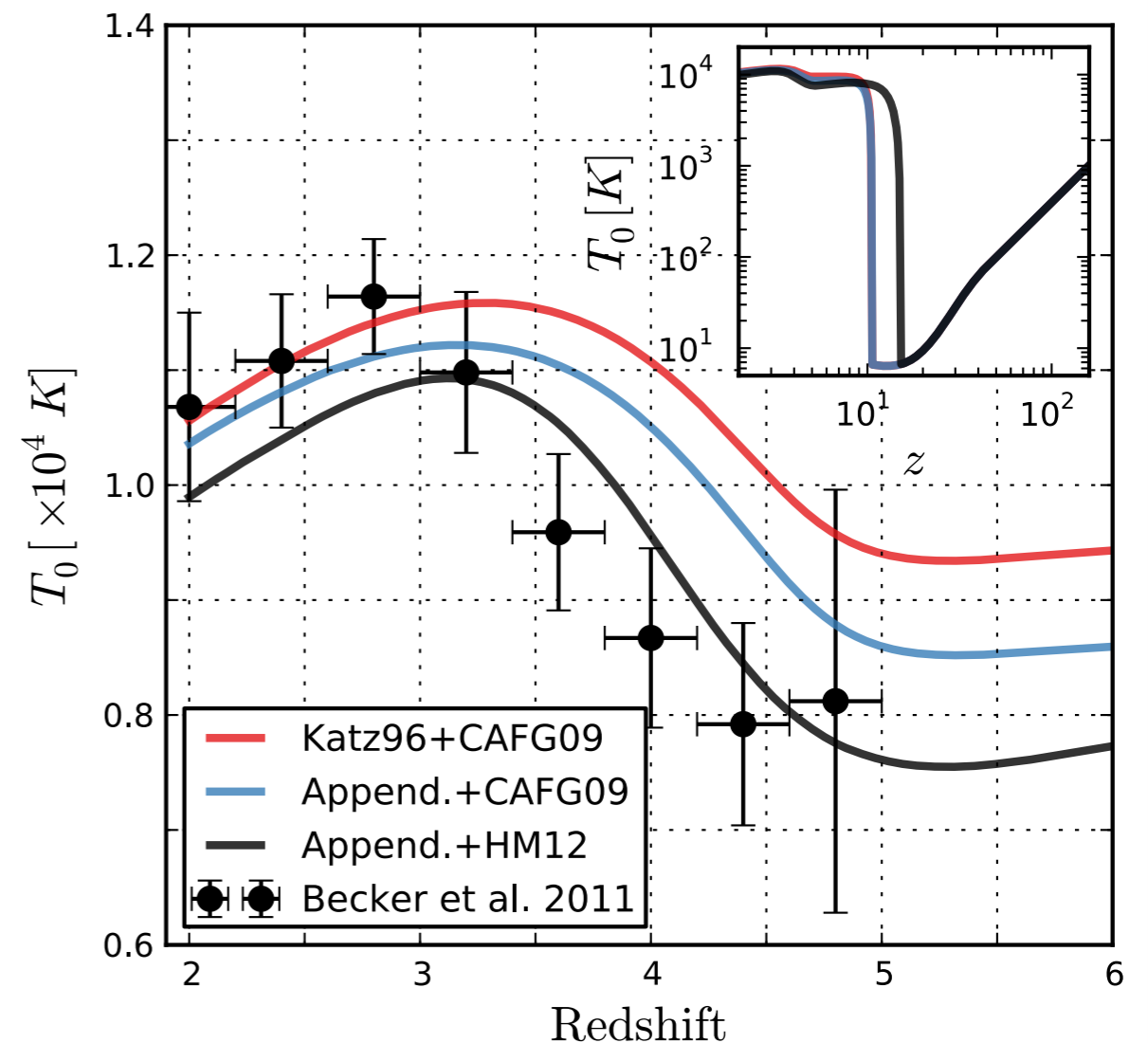
# Where the flux comes from



# Density - temperature



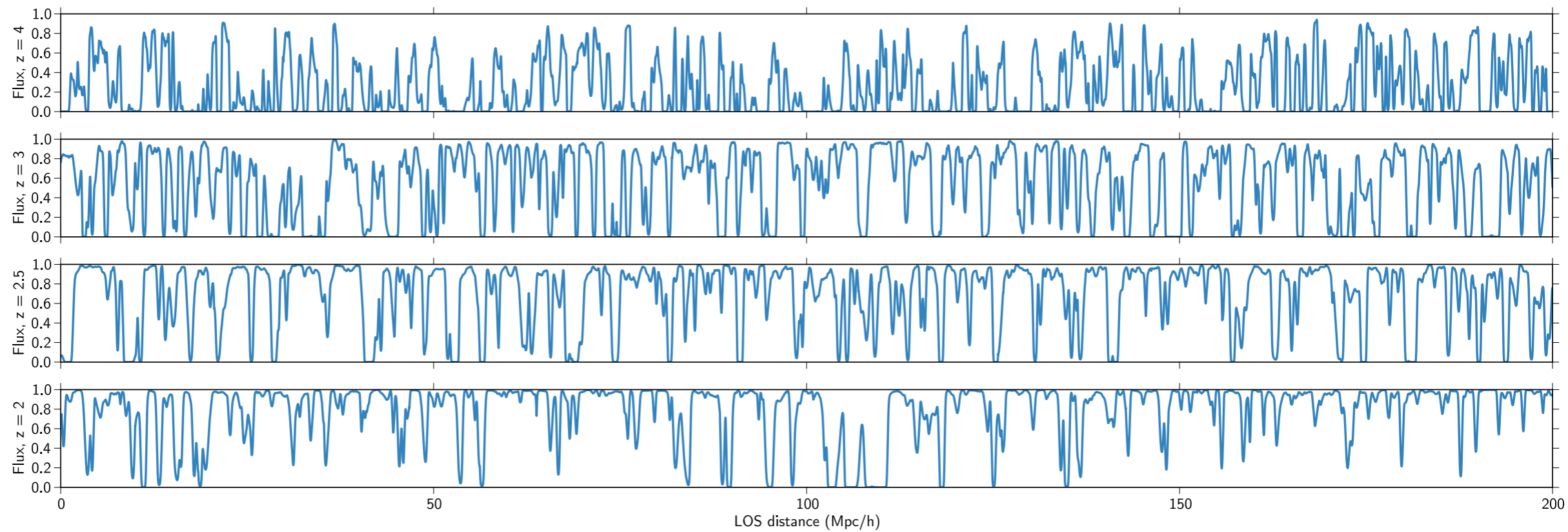
- Optically thin simulations recover basic properties of diffuse IGM



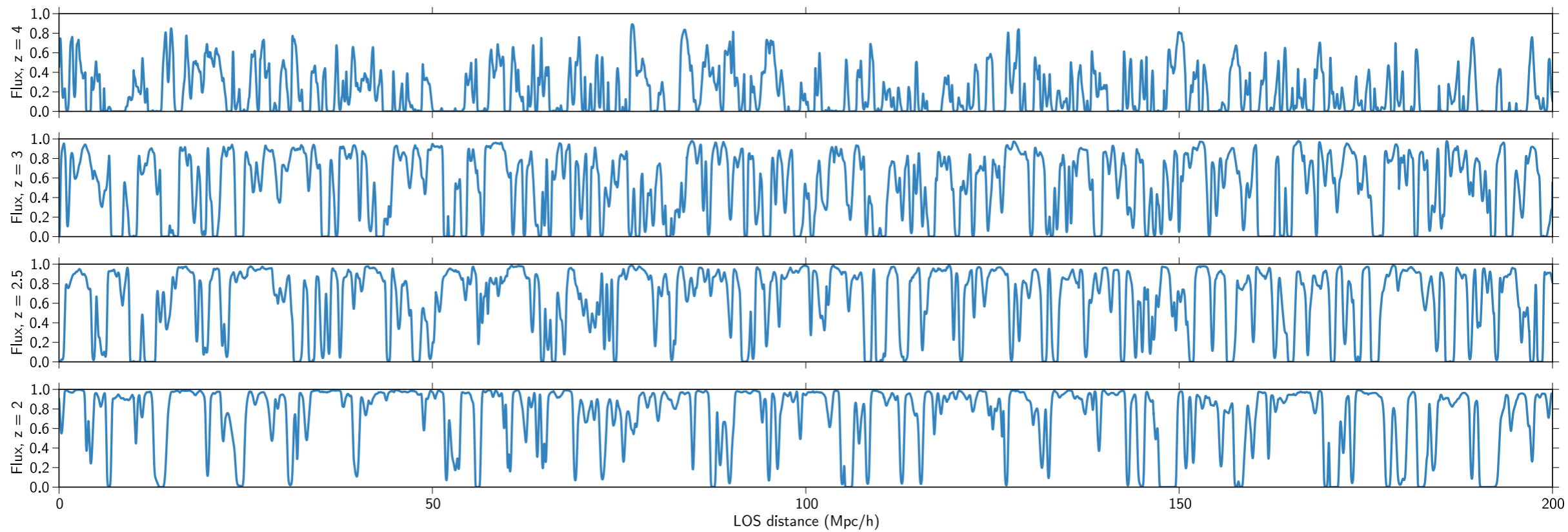
$$T = T_0 \left( \frac{\rho}{\rho_0} \right)^{\gamma-1}$$



$\sigma_8 = 1.0$



$\sigma_8 = 0.8$

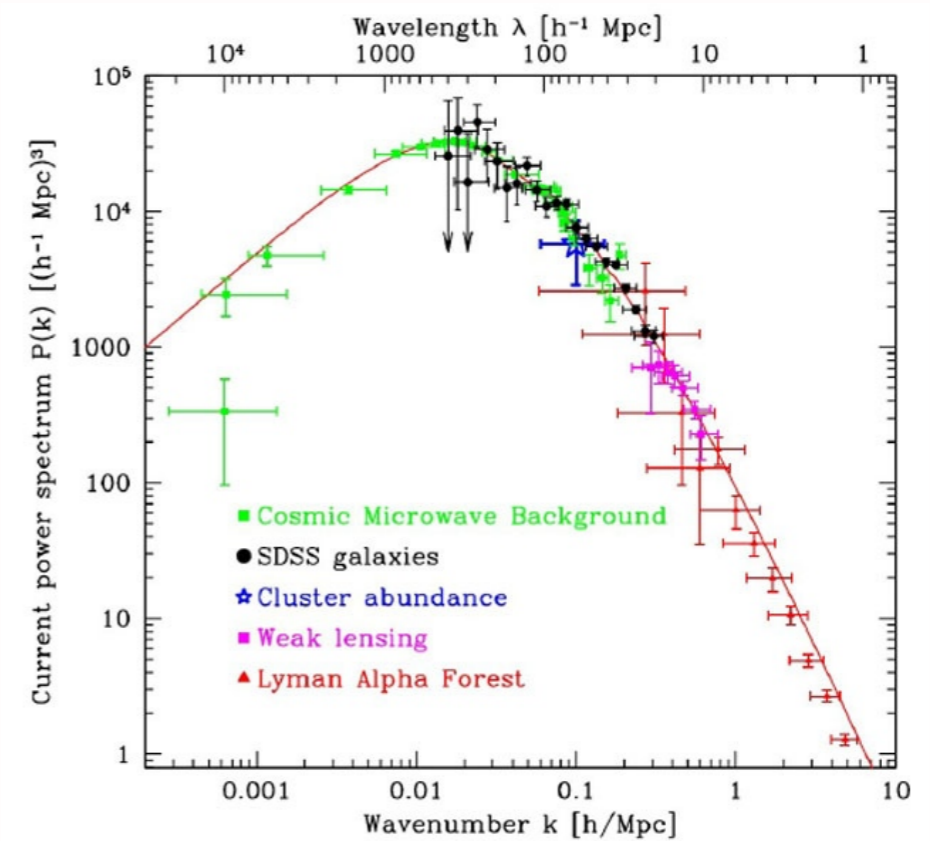
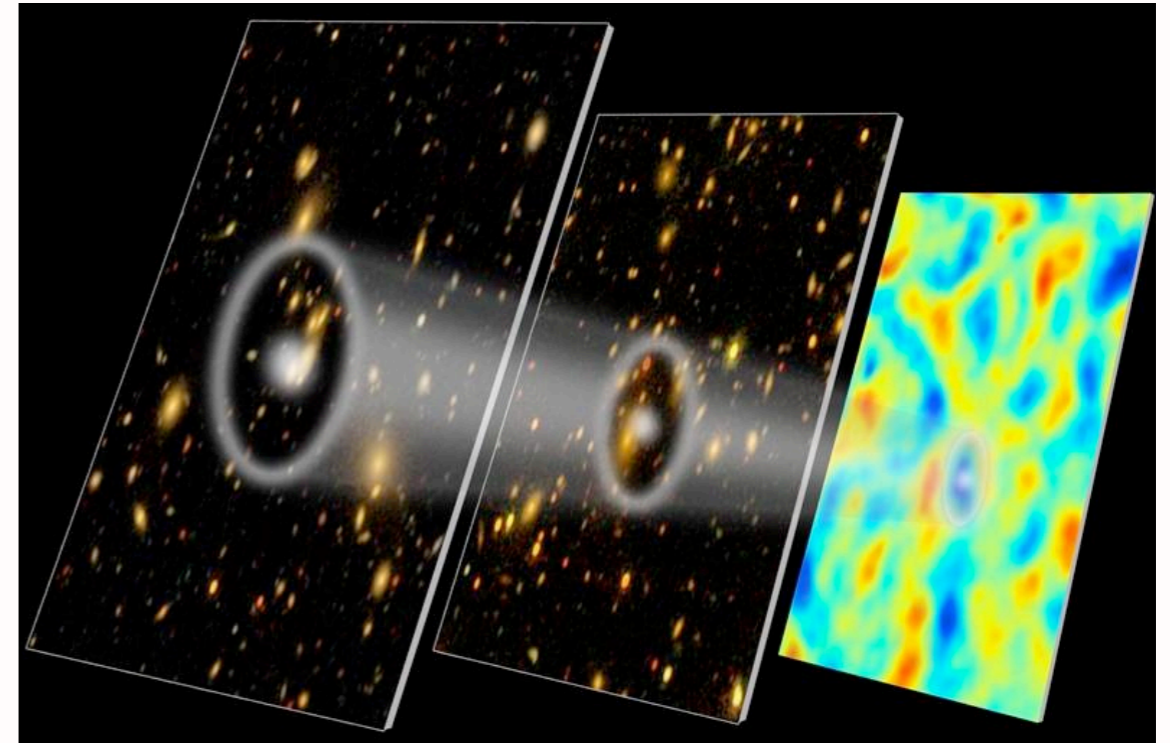


# Observables

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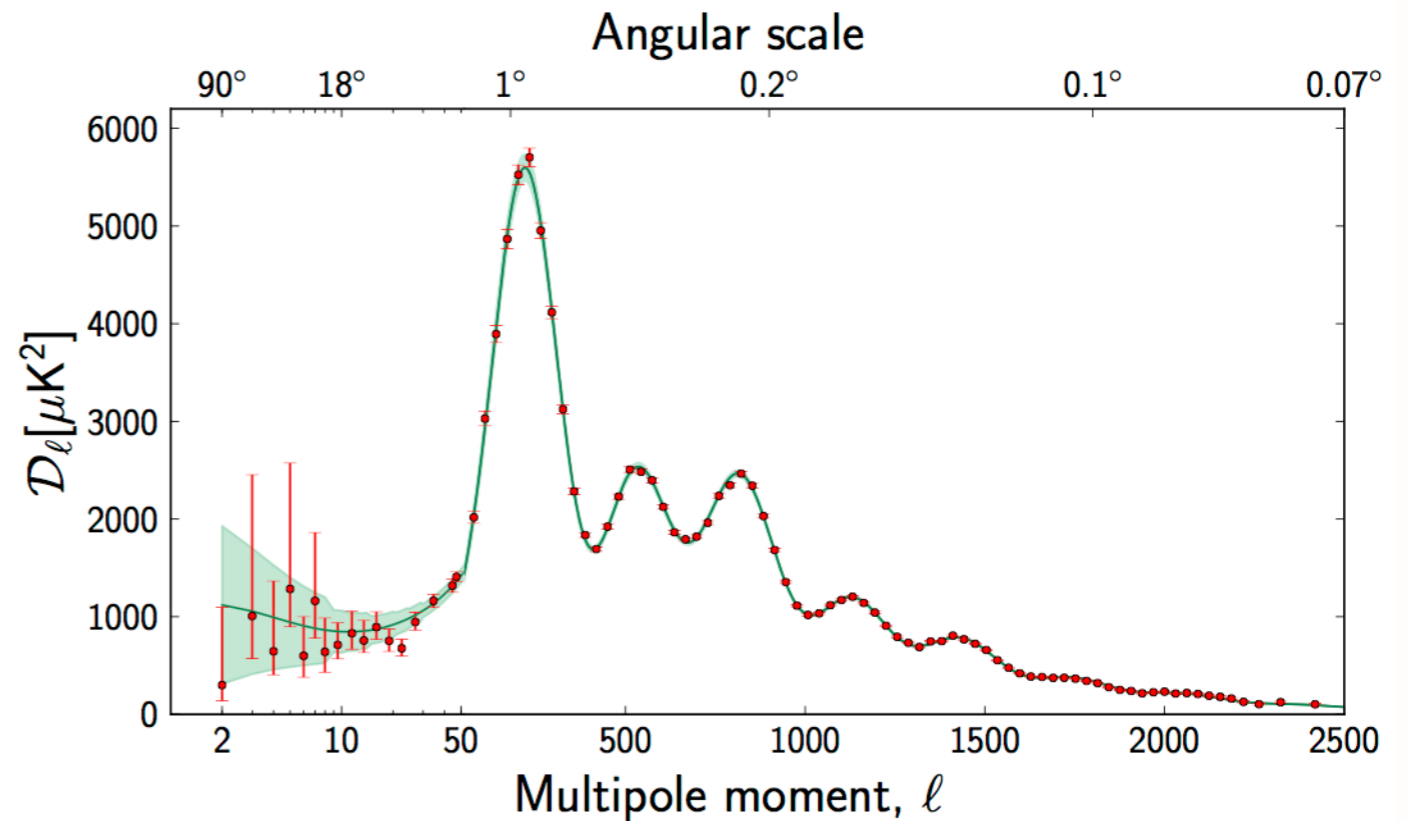
# Flux $P(k)$

- On large scales, Ly $\alpha$  flux is a biased tracer of matter. Use BAO to constrain cosmological parameters. **Simulations of limited value.**
- On small scales, Ly $\alpha$  flux  $P(k)$  can be modeled from first principles. Handle on neutrino mass, warm dark matter, inflation... **Simulations essential.**

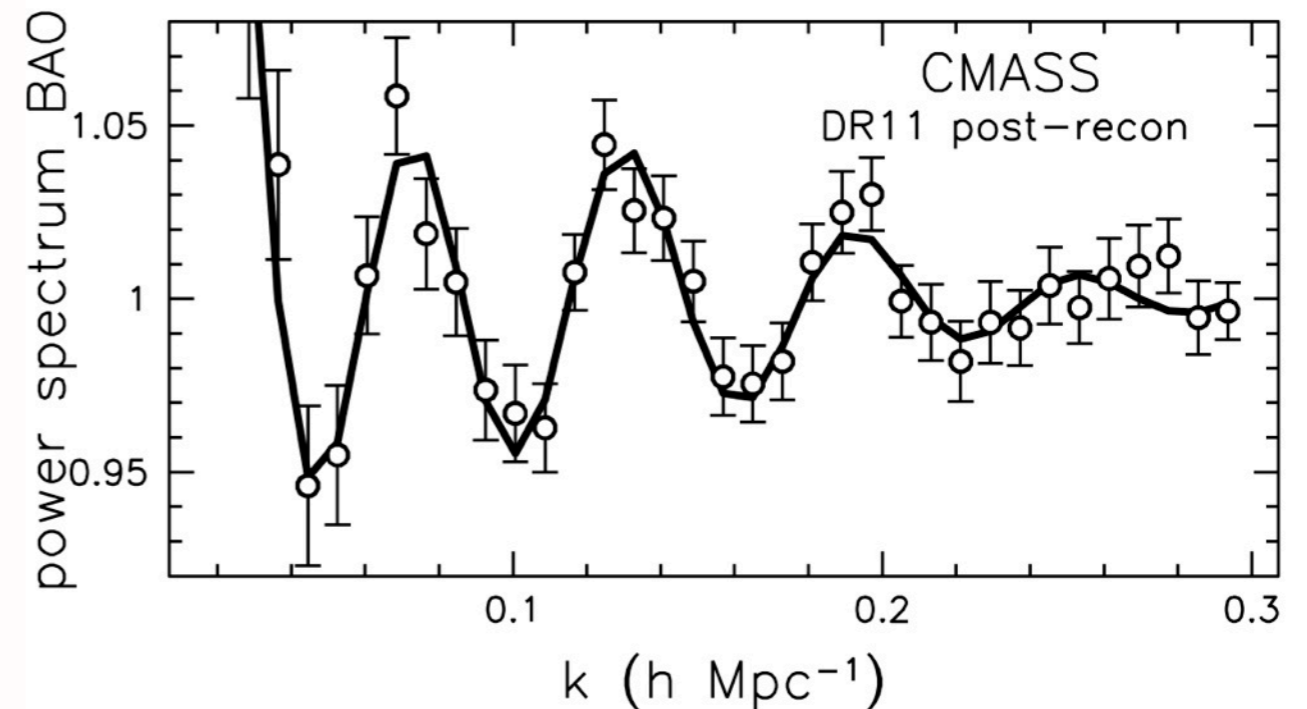


# Large scales: BAO

- CMB,  $z \sim 1000$   
(Planck collaboration)



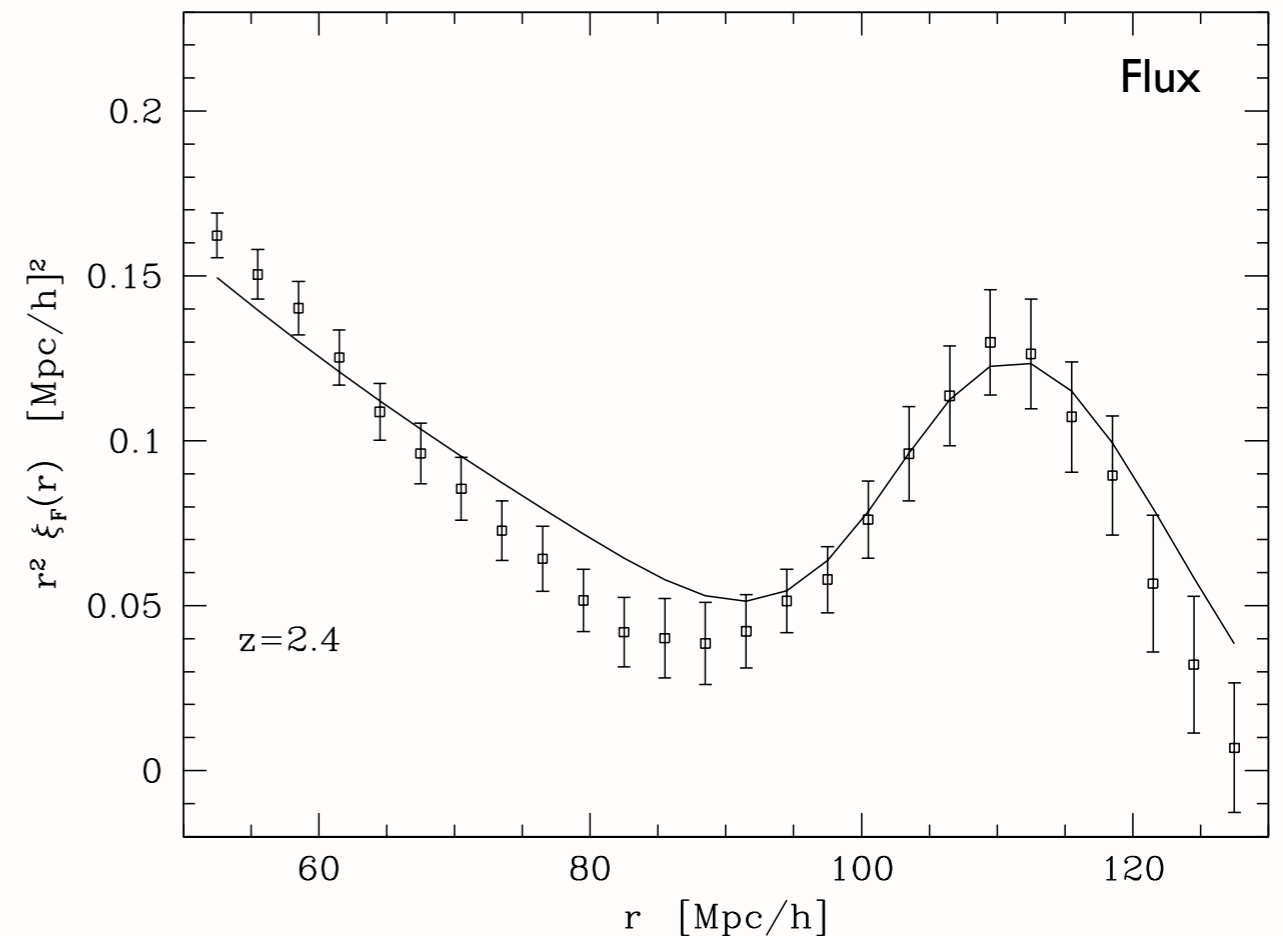
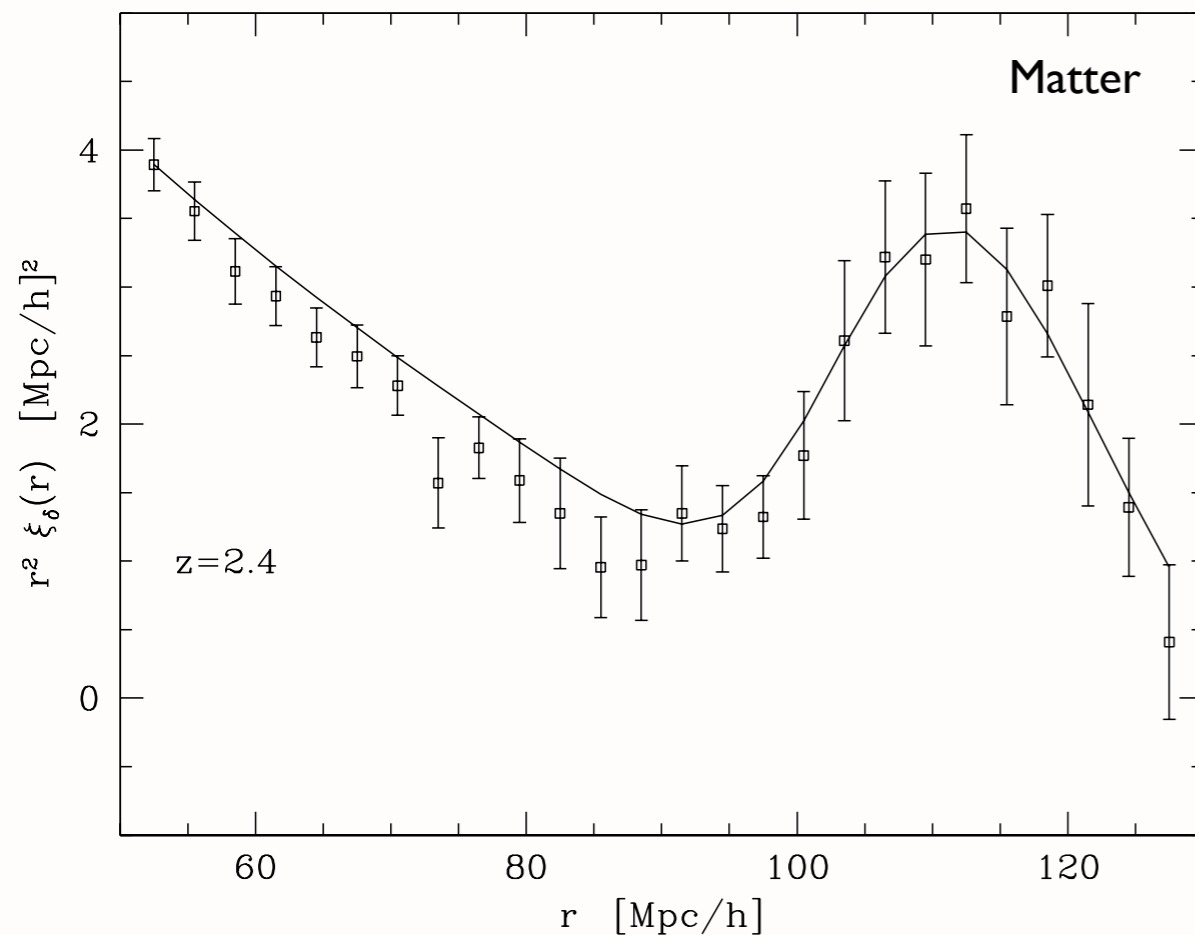
- Galaxies,  $z \sim 0.5$   
(BOSS, Anderson et al. 2014)



# BAO



- Different redshift range with Ly- $\alpha$ :  $2 < z < 5$
- Roadrunner, gravity only simulations: 750 Mpc/h box,  $4000^3$  particles/grid



White et al. (2010)

# Non-grav. contribution



## 1. Fluctuations in ionizing radiation:

Place quasars at random, assign luminosities, assume isotropic emission.

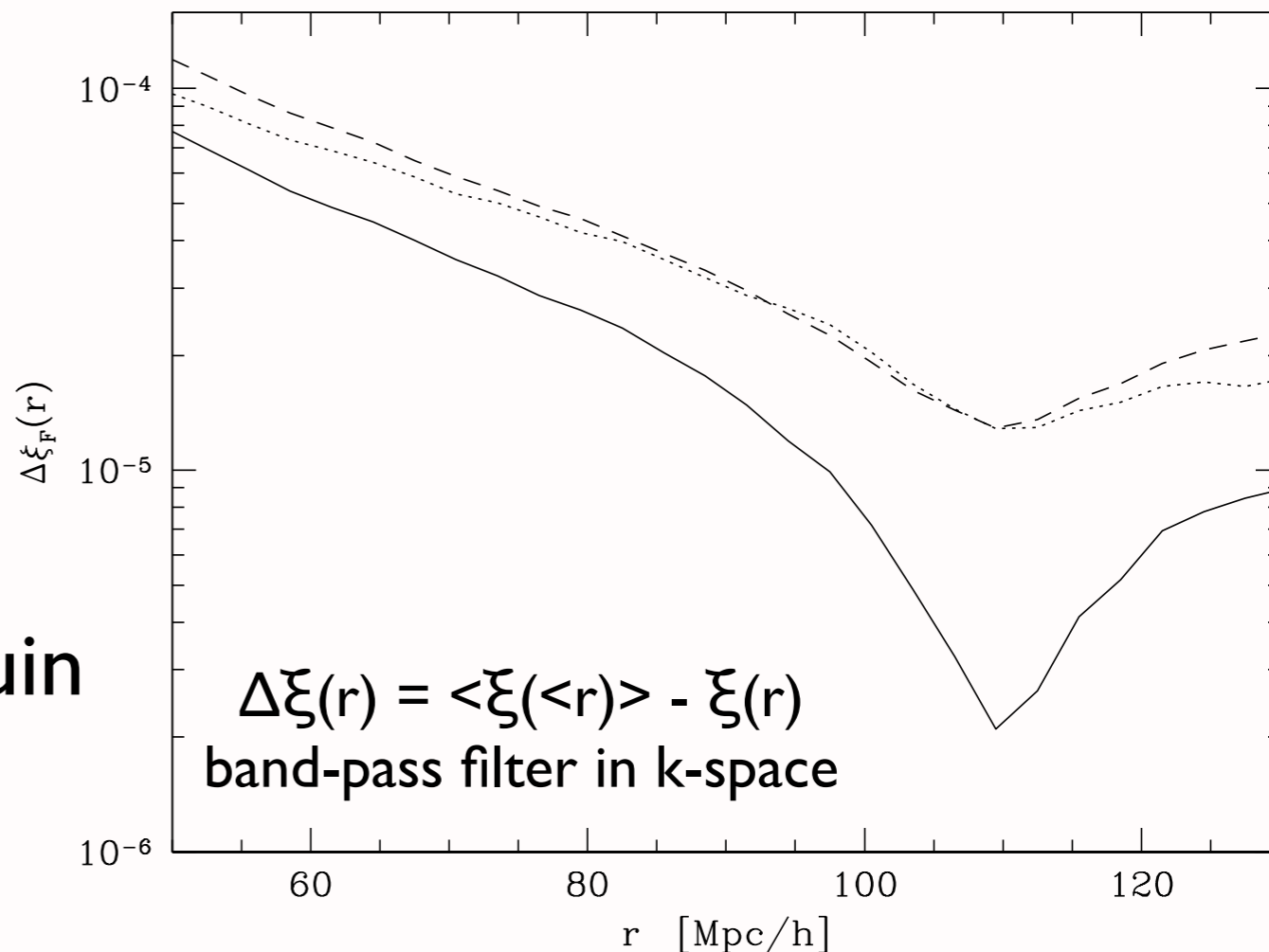
$$\Phi \propto \frac{1}{(L/L_*)^{-\alpha} + (L/L_*)^{-\beta}} \quad (\text{Croom et al. 2004})$$

$$\Gamma_i \propto L_i \frac{e^{-r_i/r_0}}{4\pi r_i^2} \quad (\text{Meiksin \& White 2004})$$

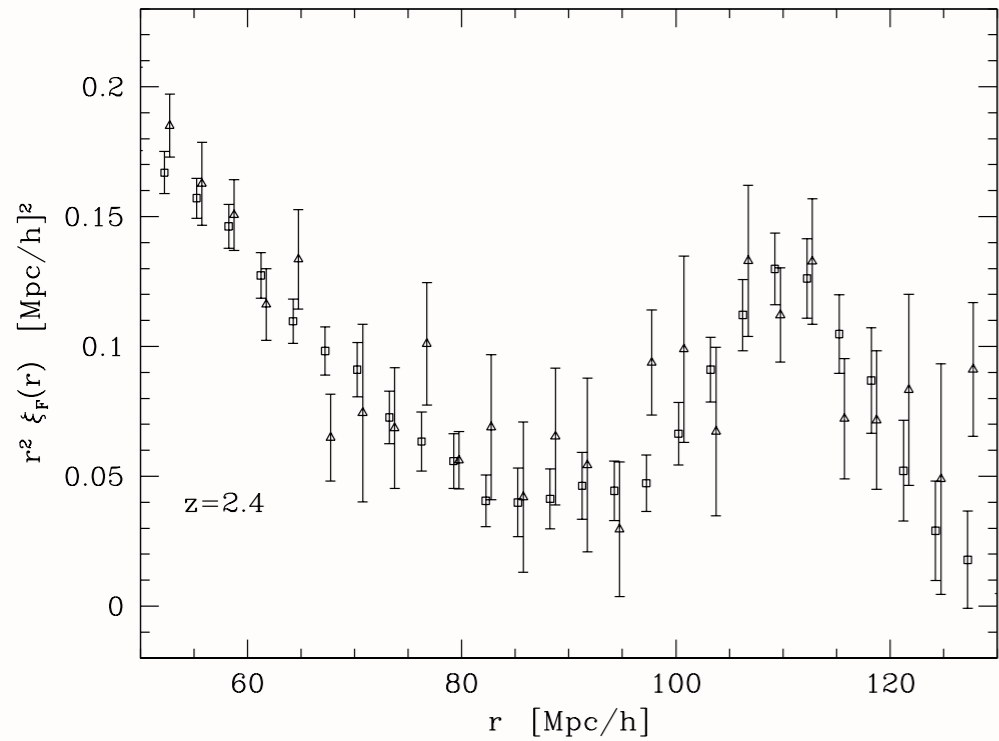
## 2. IGM temperature

Hell reionization at  $z \sim 3$  (McQuinn et al. 2009...)

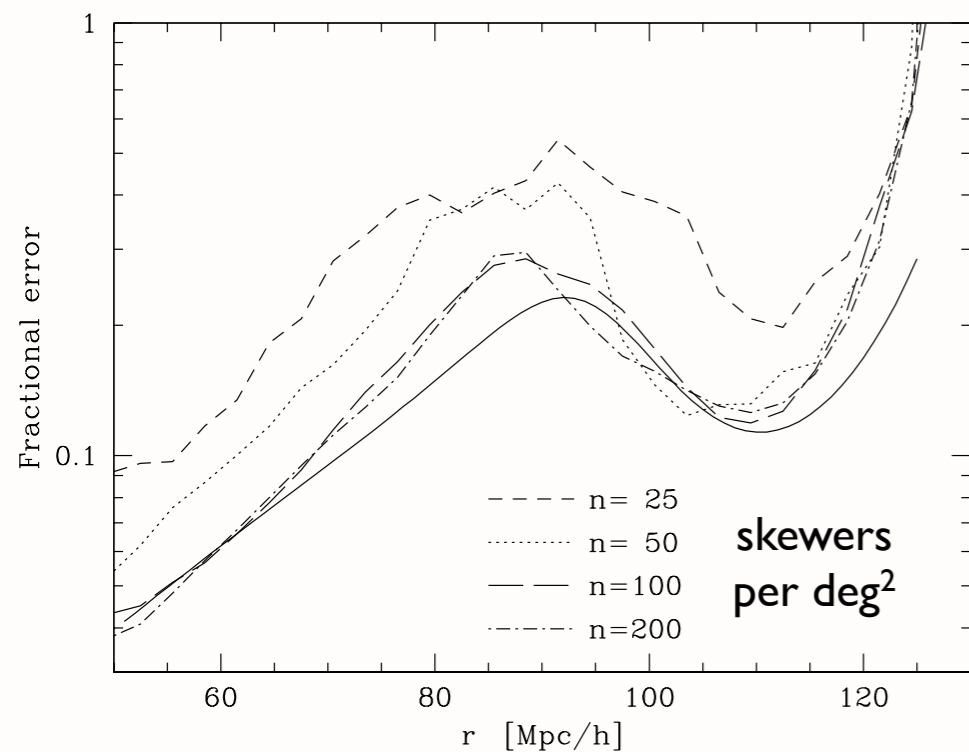
$T_0$  from log-normal dist.



# Simulating BAO peak



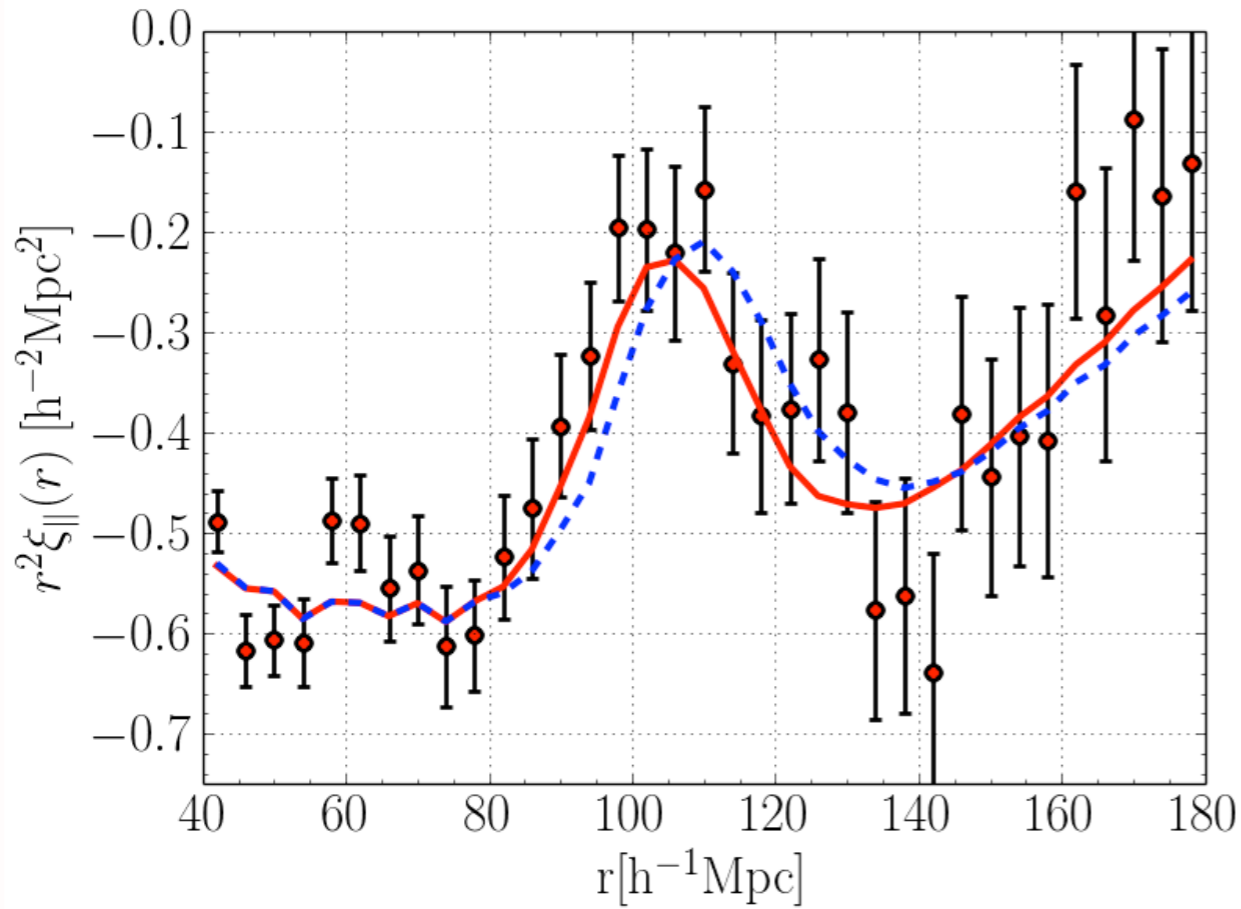
- Adding uncorrelated Gaussian noise



- Change in LOS areal density: saturation at 50-100  $\text{deg}^{-2}$ ; B-band  $m \sim 23$  cutoff

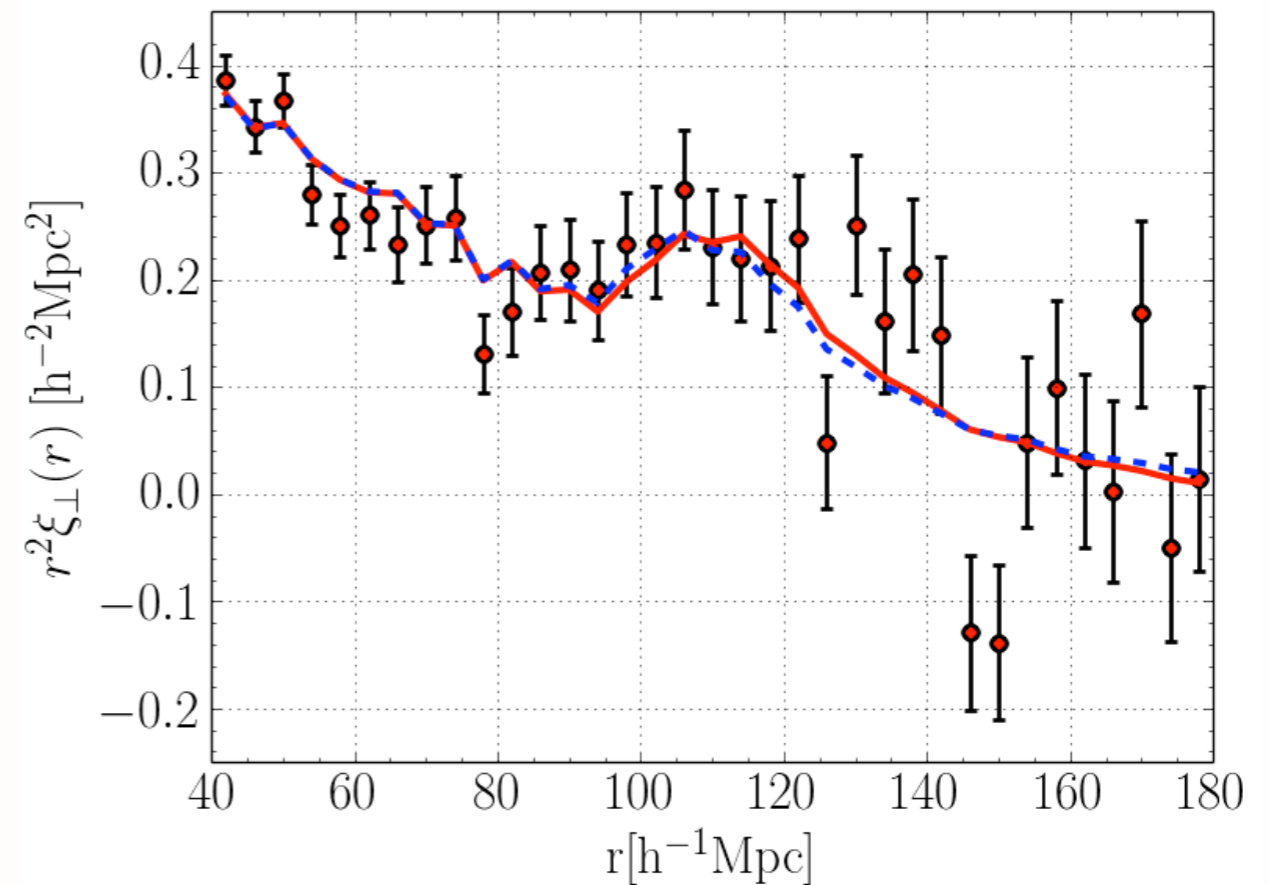
Matches MS-DESI

# Measurement



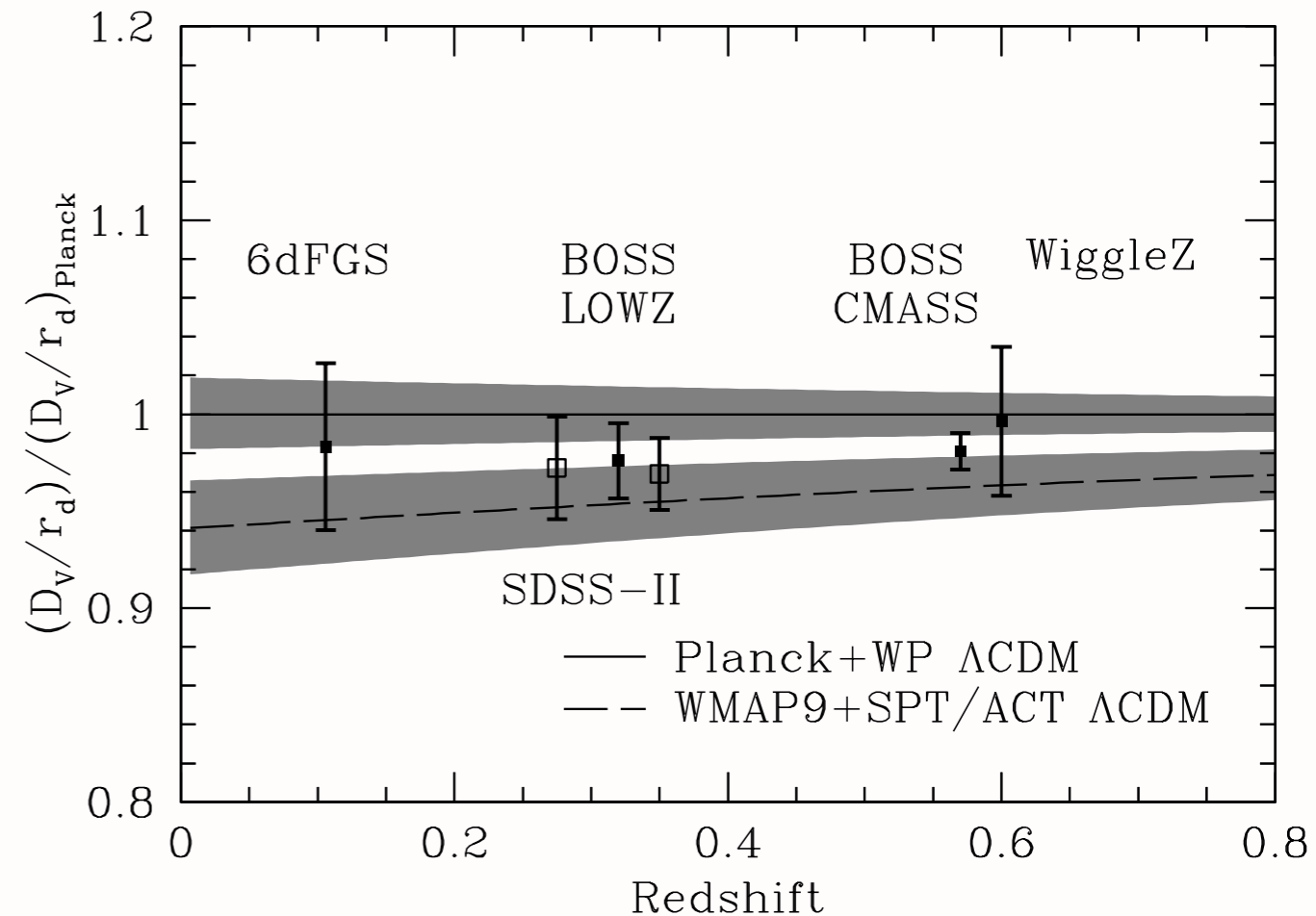
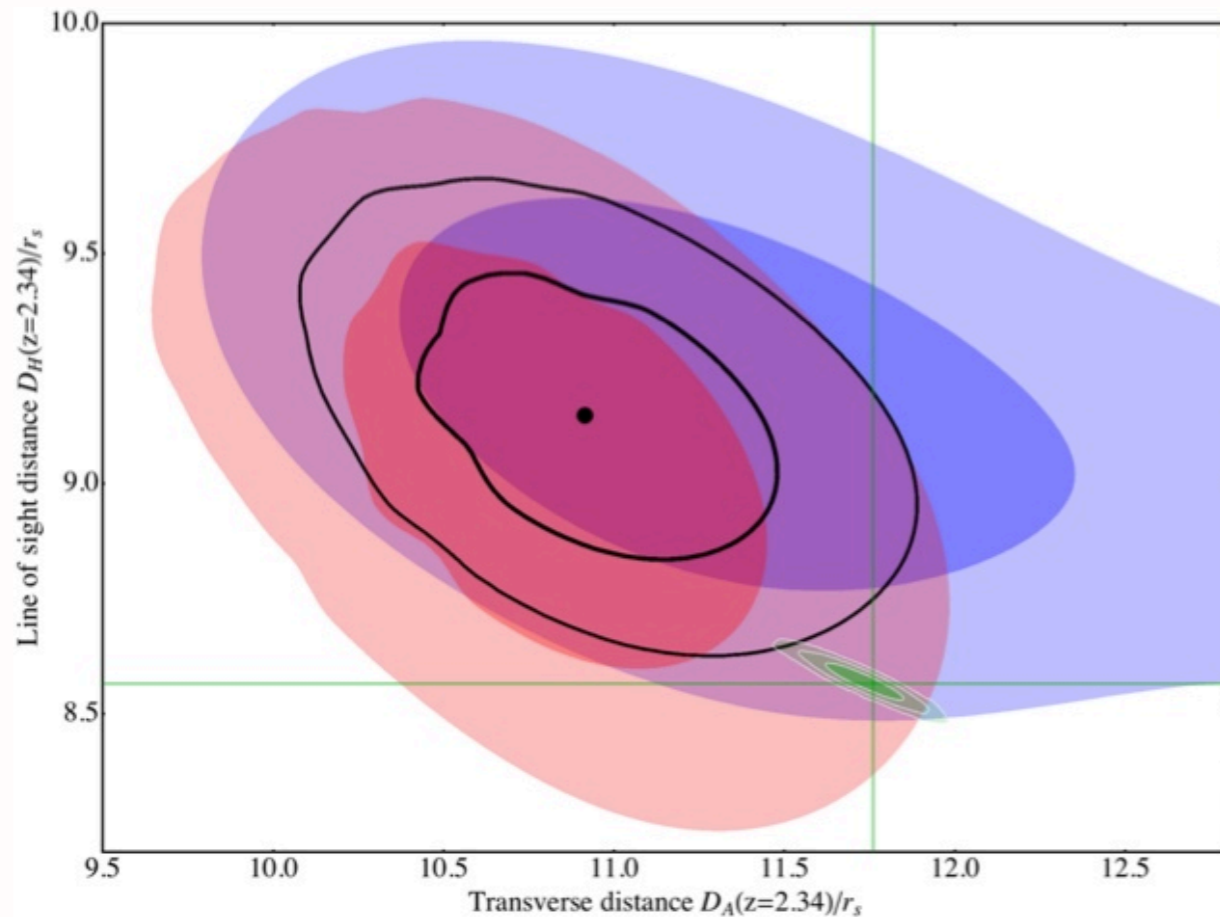
**BOSS Ly-a BAO:**

**Delubac et al. 2014**





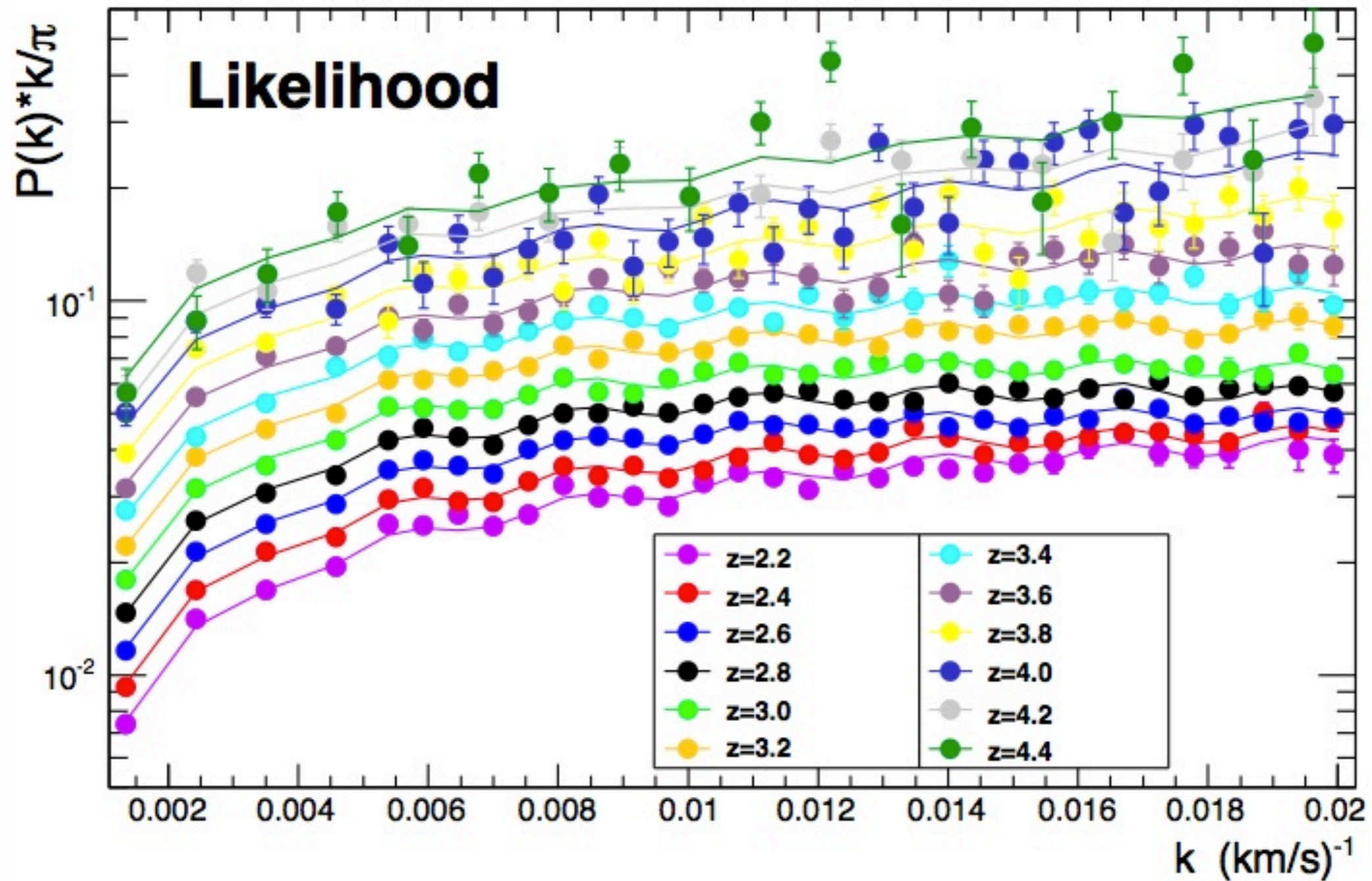
# Ly-a tension



LyA: Delubac et al. 2014 +  
Font-Ribera et al. 2014

Galaxies:  
Anderson et al. 2014

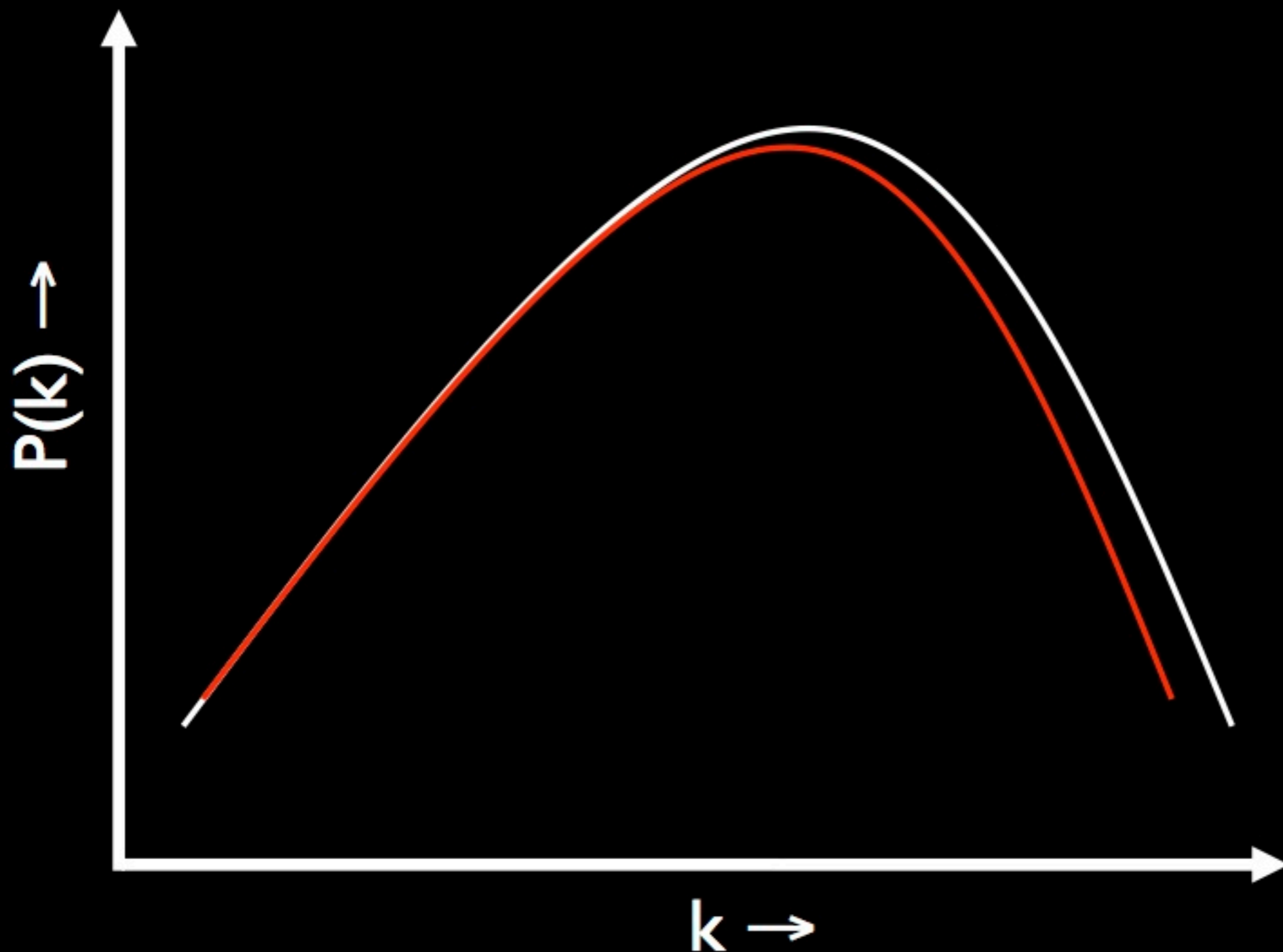
# Small scales: 1D $P(k)$



BOSS, Palanque-DeLabrouille et al. 2013

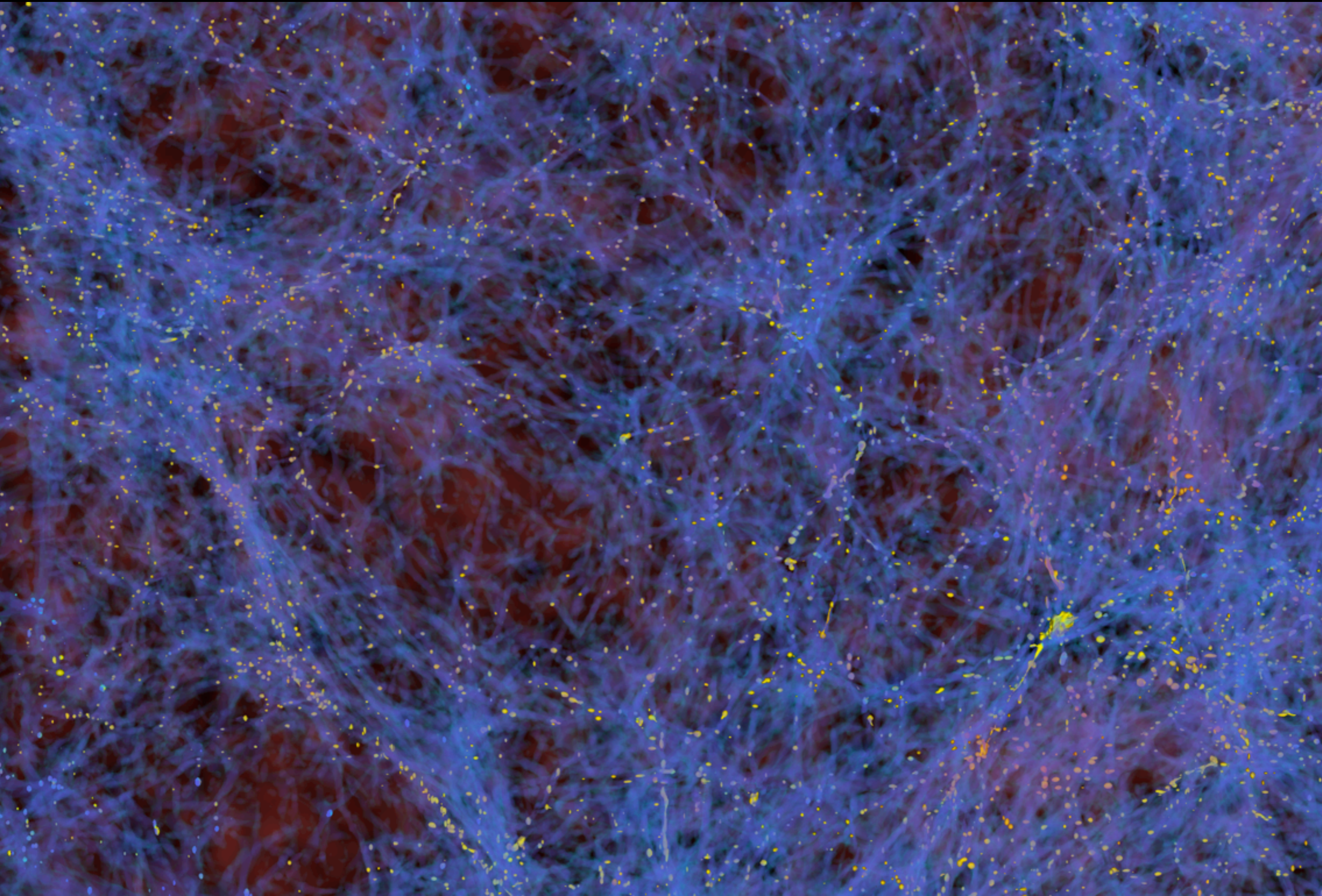
the interesting things are

masses of neutrinos  
warm dark matter  
running of the spectral index...

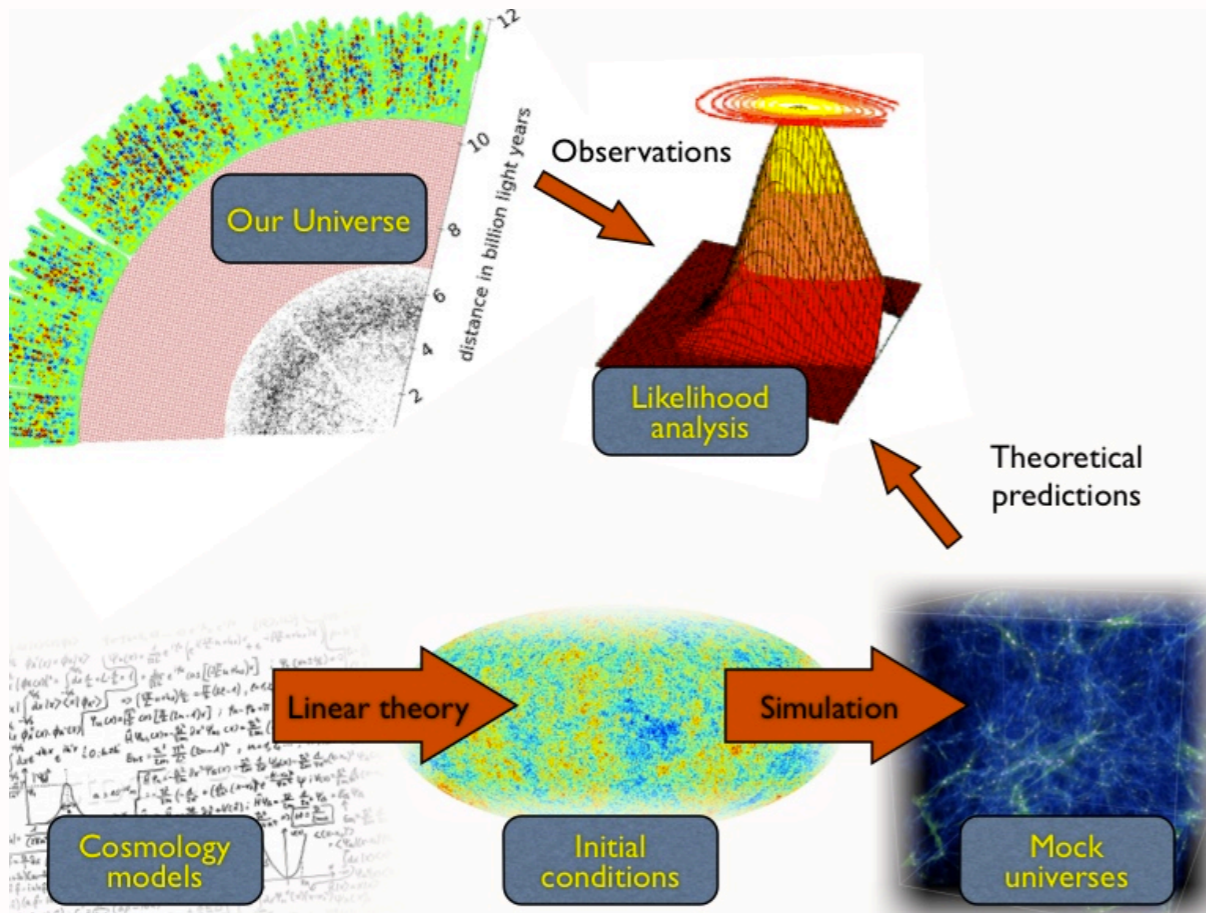


4096<sup>3</sup> hydro simulation ( $\sim 100$  Mpc/h)

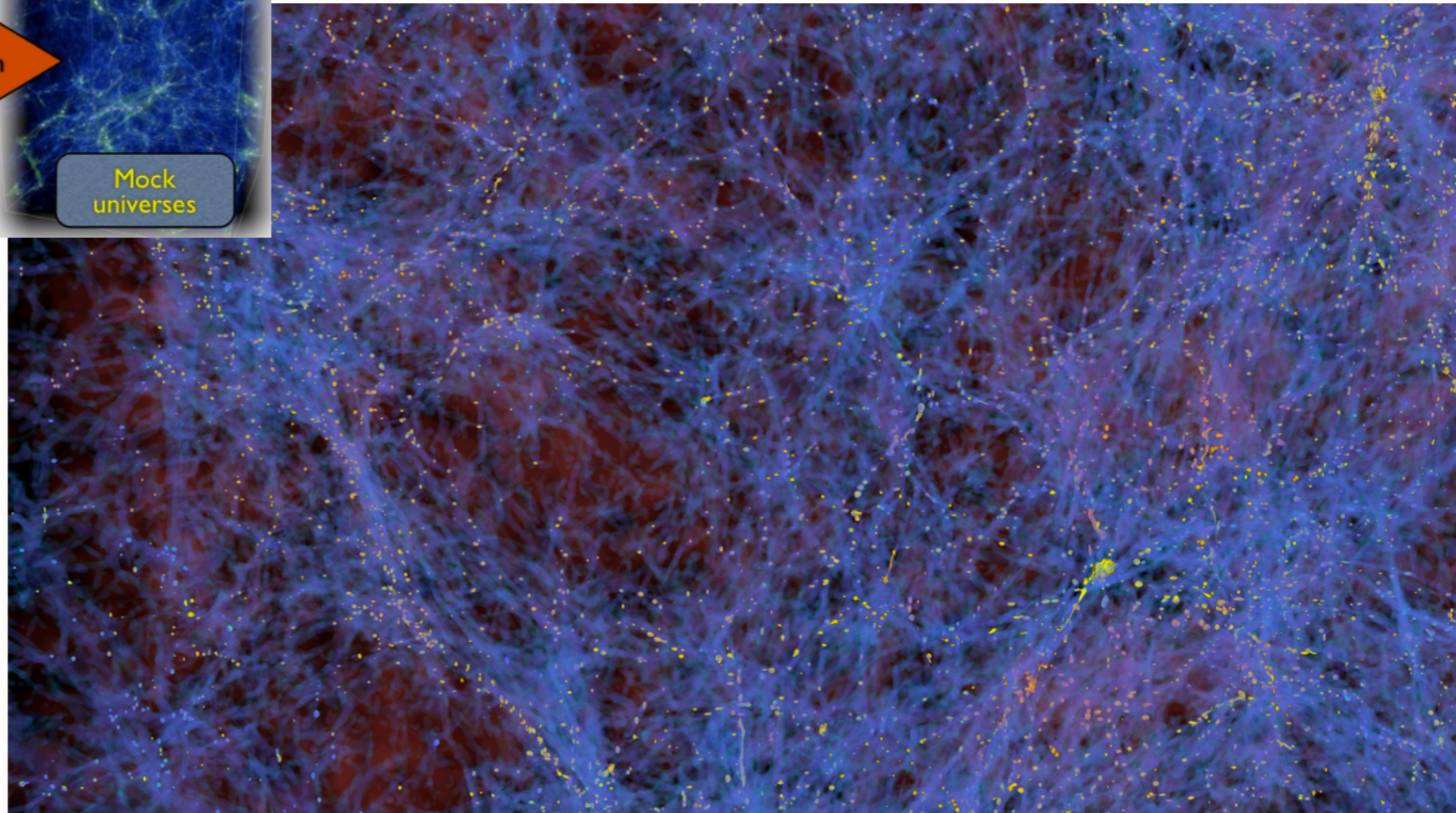
Blue:  $F \sim 0$ ; Red:  $F \sim 1$



# Ongoing work



- Building an emulator with “gold standard” simulations.



# Summary

- Ly- $\alpha$  BAO better developed than high-end  $P(k)$ , but arguably less interesting.
- Ly- $\alpha$  BAO exhibits some tension ( $\sim 2.5 \sigma$ ) with the “concordance”  $\Lambda$ CDM.
- ID  $P(k)$  promise for constraining neutrino mass and running.
- We have developed Nyx code (improved applied math engine, good scaling wrt number of processors).
- Currently running  $4096^3$  hydro simulations.
- First cosmological constraints on the way.