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Measurement of the small-scale 3D Lyman- α forest power spectrum

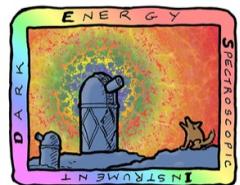
arXiv: 2310.09116

Marie Lynn Abdul Karim

Action Dark Energy - 7th edition

7 November 2023 - Annecy

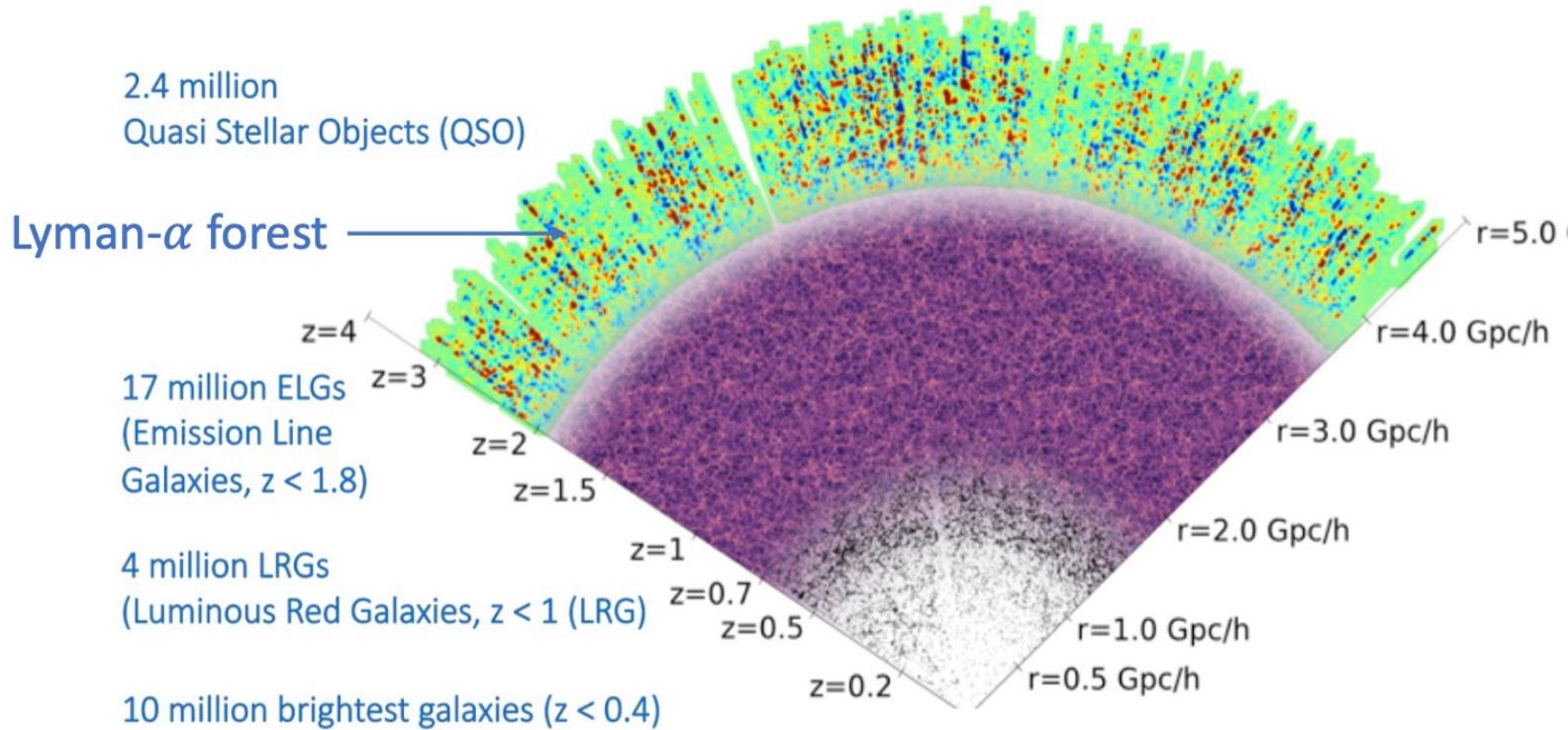
With Eric Armengaud, Guillaume Mention



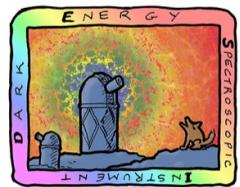
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DESI tracers of matter: Lyman- α forest



- Tracer of interest: Lyman- α forest (Ly α)
- Best tracer of the matter distribution in the universe at $z > 2$

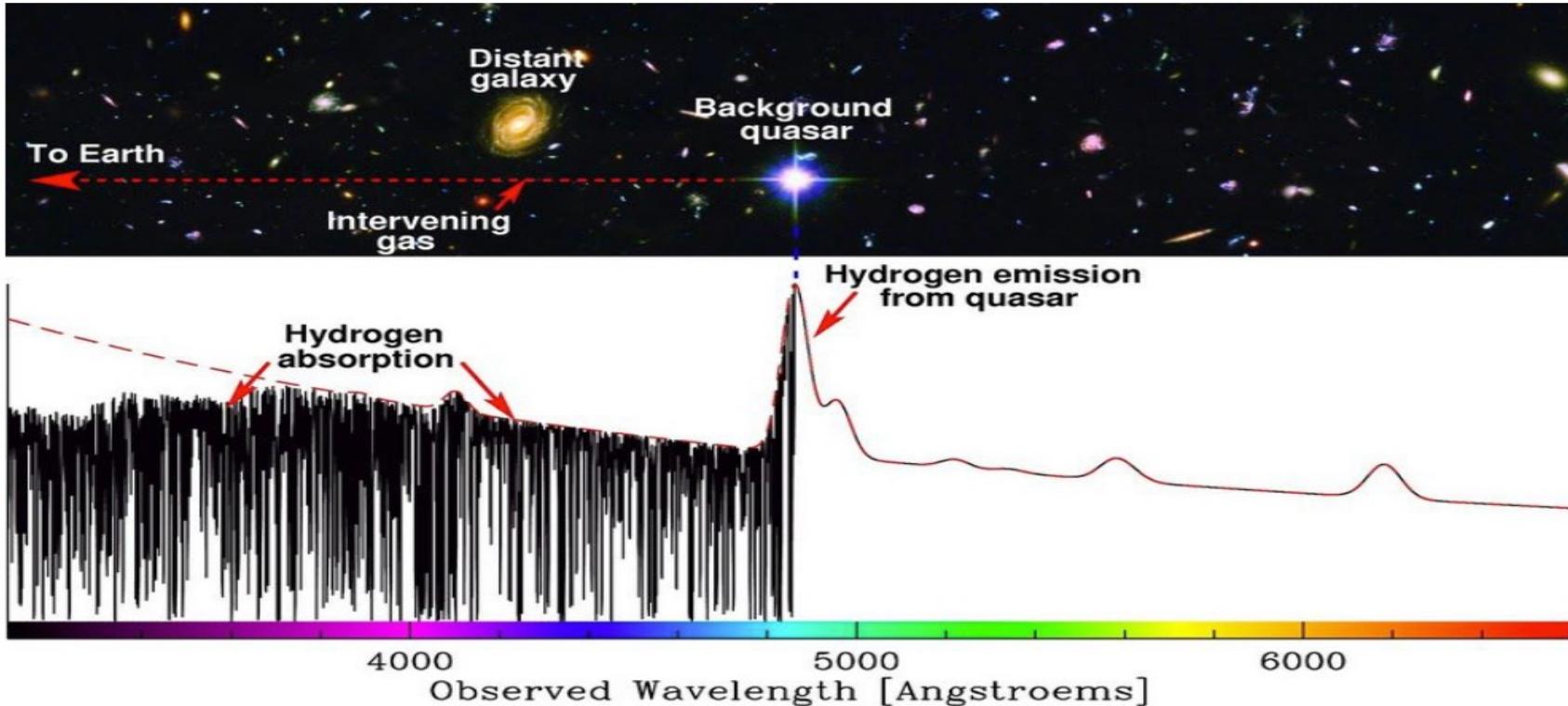


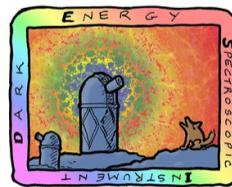
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Ly α forest

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- Ly α transition between ground state $n=1$ and first excited state $n=2$ of HI ($\lambda_{\text{Ly}\alpha} = 1215.17 \text{ \AA}$)
- Absorption by neutral hydrogen HI at $\lambda_{\text{absorption}} = \lambda_{\text{Ly}\alpha}(1 + z_{\text{HI}})$
- Measurement along the quasar's line-of-sight (LOS)
- Ly α forest encodes the density fluctuations of matter $\longrightarrow \delta_F$: density contrast





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1D Power Spectrum: first DESI samples

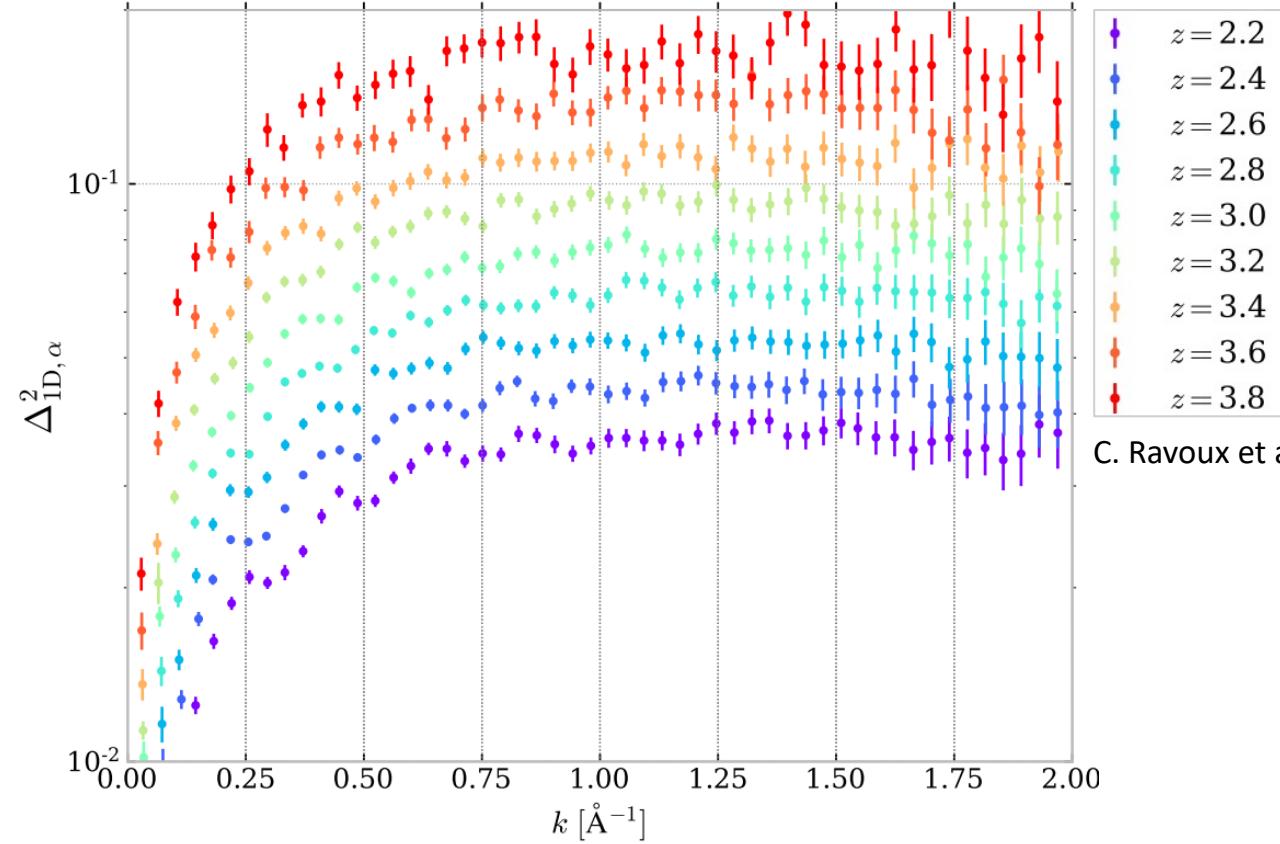
LOS



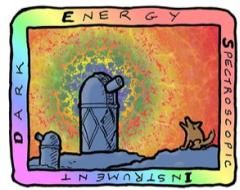
FFT

$$\langle \tilde{\delta}_F \tilde{\delta}_F^* \rangle$$

$$P_{1D,\alpha}(k_{\parallel})$$

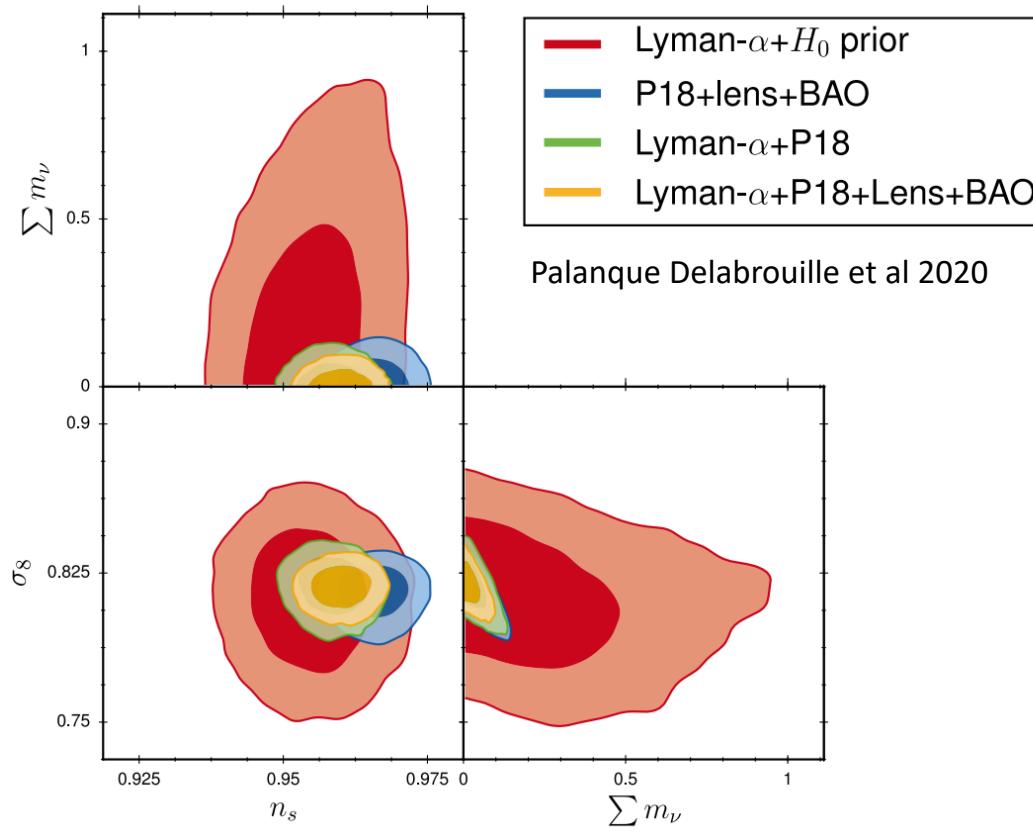


- Cosmological observable: Ly α forest power spectrum at **small scales**
- P_{1D} : measurement of power spectrum along the quasar's LOS
- Measured P_{1D} for the first DESI Ly α forest sample (EDR) with the Fast Fourier Transform method

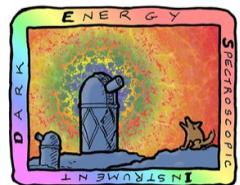


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- Fit P_{1D} with a model from hydrodynamical simulations
- Main cosmological observables: (Amplitude, Slope) of the linear matter power spectrum $P_L(k)$ at $k_{Ly\alpha}$ and $z_{Ly\alpha}$ => Constraints on σ_8 , n_s – See plot (eBOSS P_{1D} in agreement with Planck)
=> Constraints on neutrino properties: $\sum m_\nu$
- Also: DM properties (small scale cut-off in $P_L(k)$)



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3D Power Spectrum: Extending P_{1D}

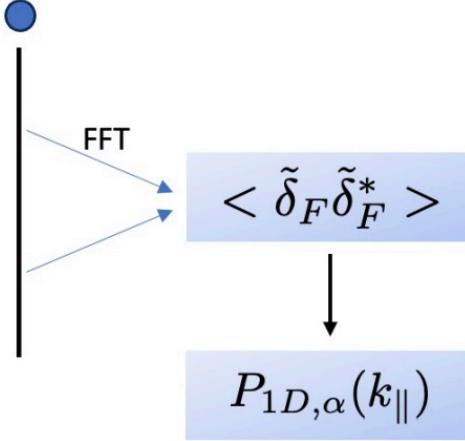
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- P_{1D} : Correlating δ_F in independent LOS separately
- P_{3D} : Correlating δ_F across different LOS
- High density of quasars with eBOSS and DESI $\longrightarrow P_{3D}$

$$P_{1D}(z, k_{\parallel}) = \int \frac{d^2 k_{\perp}}{(2\pi)^2} P_{3D}(z, k_{\perp}, k_{\parallel})$$

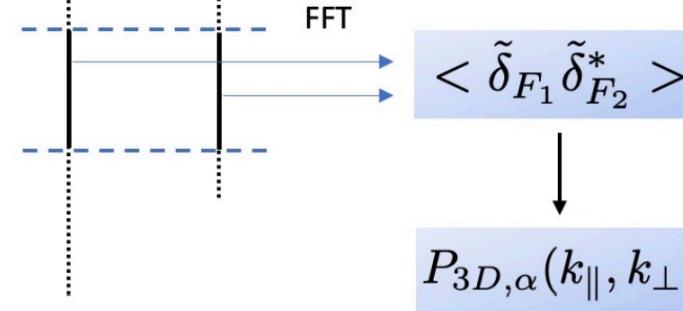
$$P_{3D}(z, k_{\perp}, k_{\parallel}) \equiv \int d^2 \theta e^{i \theta \cdot k_{\perp}} \int d\Delta \lambda e^{i \Delta \lambda k_{\parallel}} \xi_{3D}(z, \theta, \Delta \lambda)$$

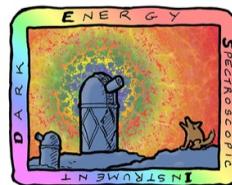
LOS



LOS₂

LOS₁





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A fast and simple estimator for P_x and P_{3D}

- P_x : cross-spectrum, a hybrid quantity between real and Fourier space :

$$\begin{aligned} P_x(z, \theta, k_{\parallel}) &\equiv \int d\Delta\lambda e^{i\Delta\lambda k_{\parallel}} \xi_{3D}(z, \theta, \Delta\lambda) \\ &= \int \frac{d^2 k_{\perp}}{(2\pi)^2} e^{i\theta \cdot \mathbf{k}_{\perp}} P_{3D}(z, k_{\perp}, k_{\parallel}) \end{aligned}$$

Font-Ribera+ 2018
Lam Hui+ 1998

- P_{1D} is a special case of P_x : $P_{1D}(z, k_{\parallel}) = P_x(z, \theta = 0, k_{\parallel})$
- A fast and simple estimator for P_x : $\delta_{i:LOS}(\lambda) \xrightarrow{\text{FFT}} \delta_{i:LOS}(k_{\parallel})$

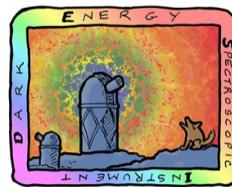
Computation of angular separation for all possible pairs of LOS ij



Estimator:
$$P_x(\theta, k_{\parallel}) = \left\langle \Re \left(\tilde{\delta}_i(k_{\parallel}) \tilde{\delta}_j^*(k_{\parallel}) \right) \right\rangle$$

- The computation of P_x enables P_{3D} inference:

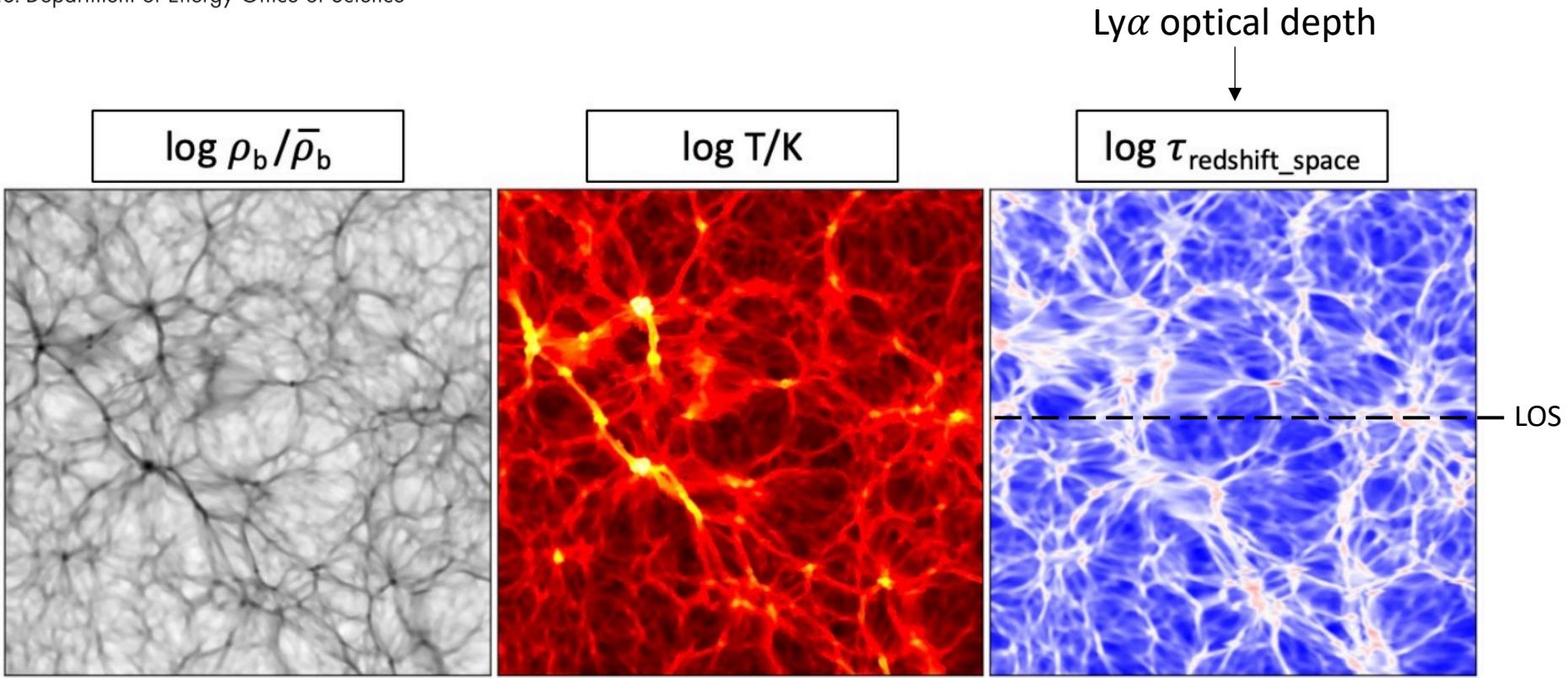
$$P_{3D}(z, k_{\perp}, k_{\parallel}) = 2\pi \int_0^\infty d\theta J_0(k_{\perp}\theta) \theta P_x(z, \theta, k_{\parallel})$$



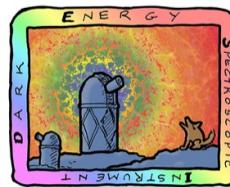
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Validation with hydrodynamical simulations

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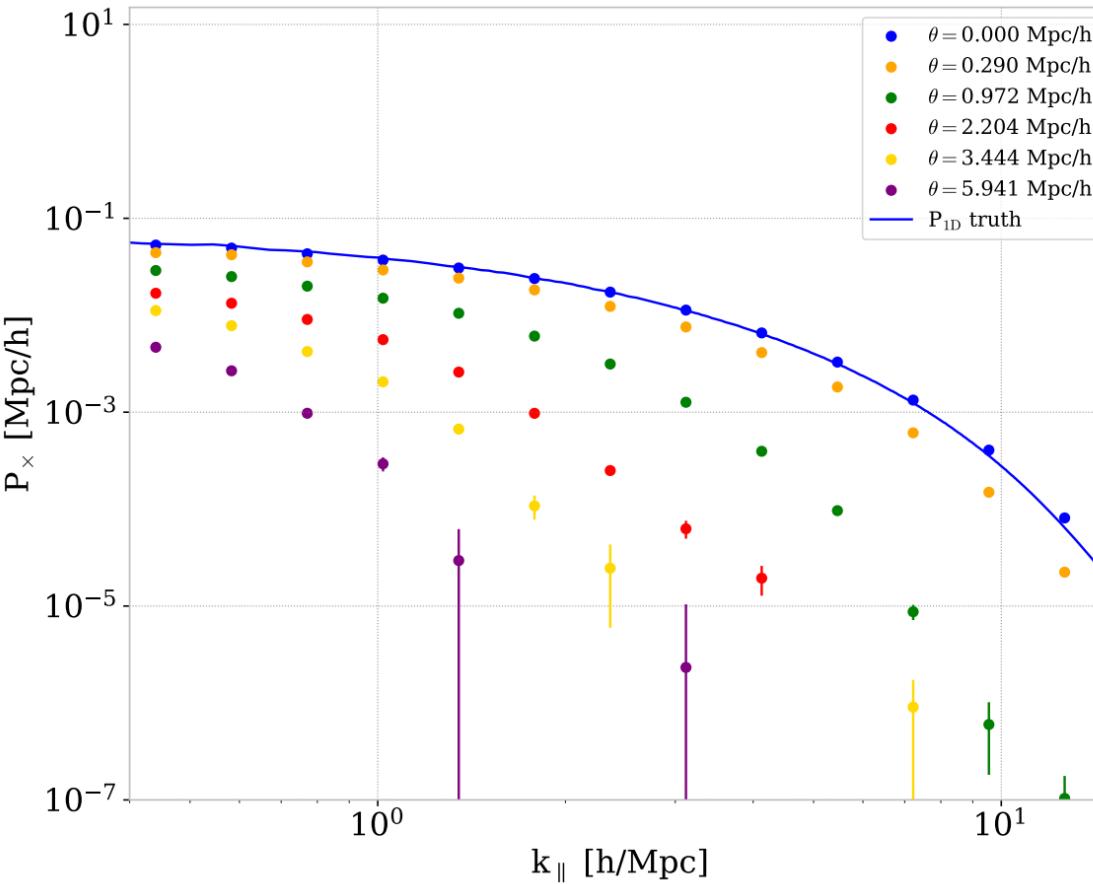


- Nyx: cosmological simulation code solving the evolution of the baryonic gas coupled to dark matter in the expanding Universe.
- Nyx snapshots at $z = 2.0$: 1536^3 cells, $150 h^{-1} \text{ Mpc}$, $\Delta\lambda = 98 h^{-1} \text{ kpc}$
- P_{3D} truth computed using gimlet: FFT 3D of the field

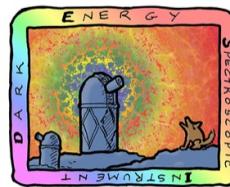


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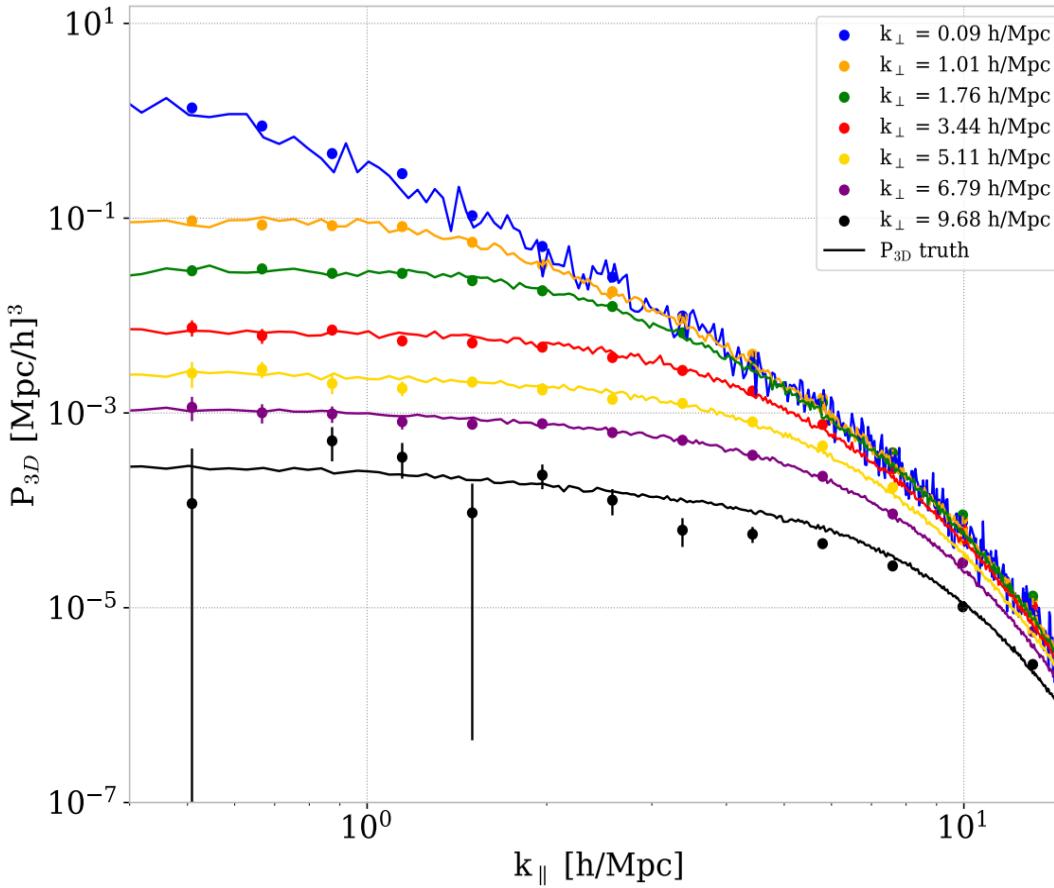


- Reference mock: 10^4 LOS drawn from Nyx box (very high density) without noise
- Overall power decreasing as function of θ
- Small-scale cut off at lower k_{\parallel} as θ increases

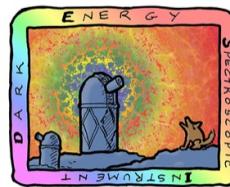


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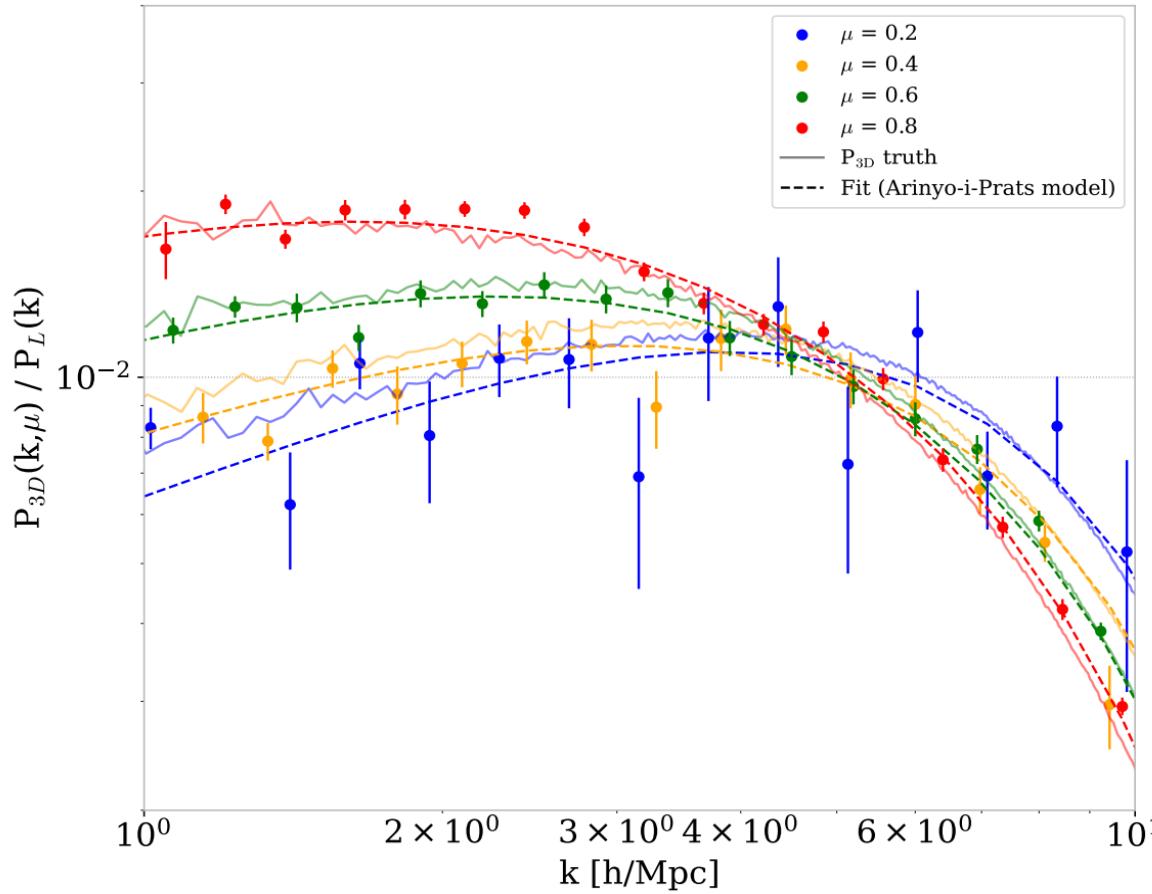
- P_{3D} in cartesian coordinates inferred from P_x with $N_{LOS} = 10^4$: good agreement with truth
- $k_{\perp,\max} = 10 \text{ h Mpc}^{-1} \propto 1 / \theta_{\min}$



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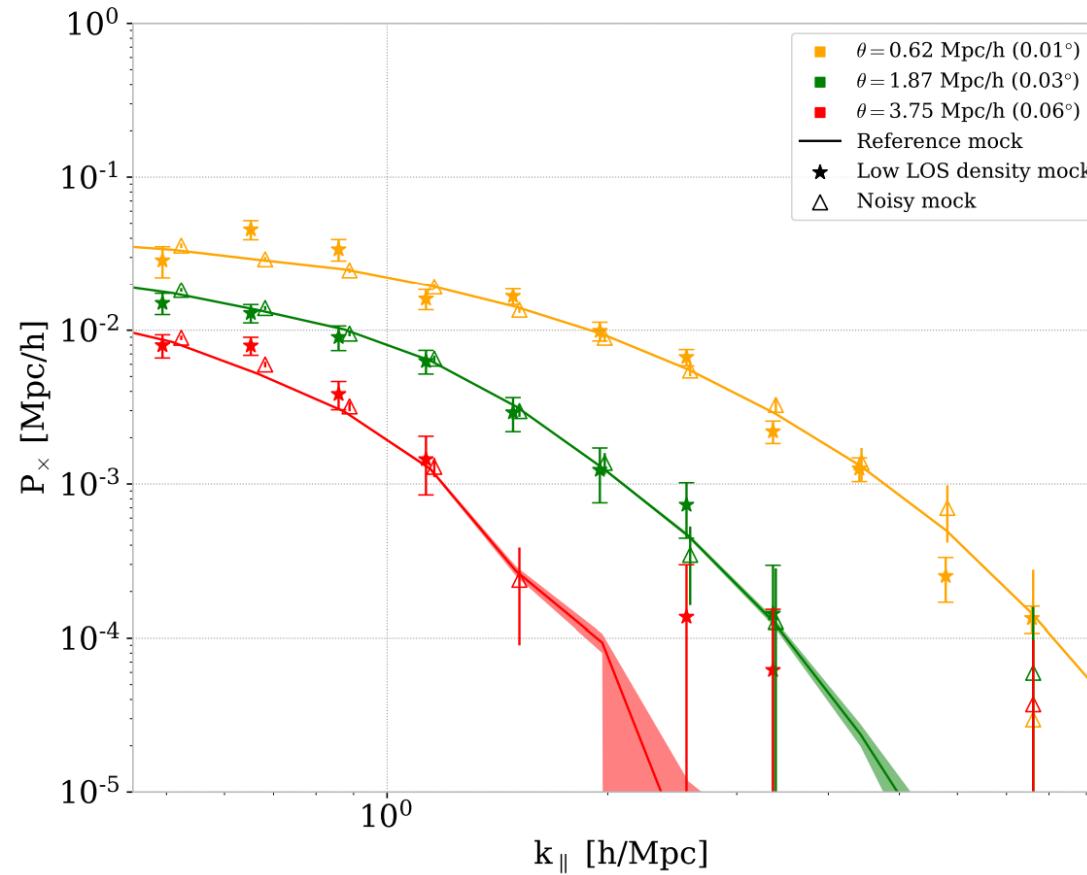
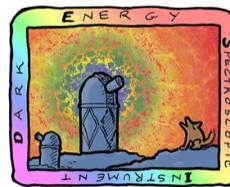
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Results with reference, high density and noiseless mock: $P_{3D}(k, \mu)$

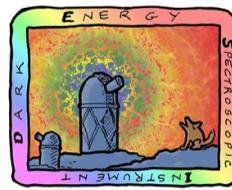


- Same measurement but in polar coordinates: $k = \sqrt{k_\perp^2 + k_\parallel^2}, \mu = k_\parallel/k$

- Fit:
$$\frac{P_{3D}(k, \mu)}{P_L(k)} = b^2 (1 + \beta \mu^2)^2 \exp \left((q_1 \Delta^2(k) + q_2 \Delta^4(k)) \left[1 - \left(\frac{k}{k_v} \right)^{a_v} \mu^{b_v} \right] - \left(\frac{k}{k_p} \right)^2 \right)$$



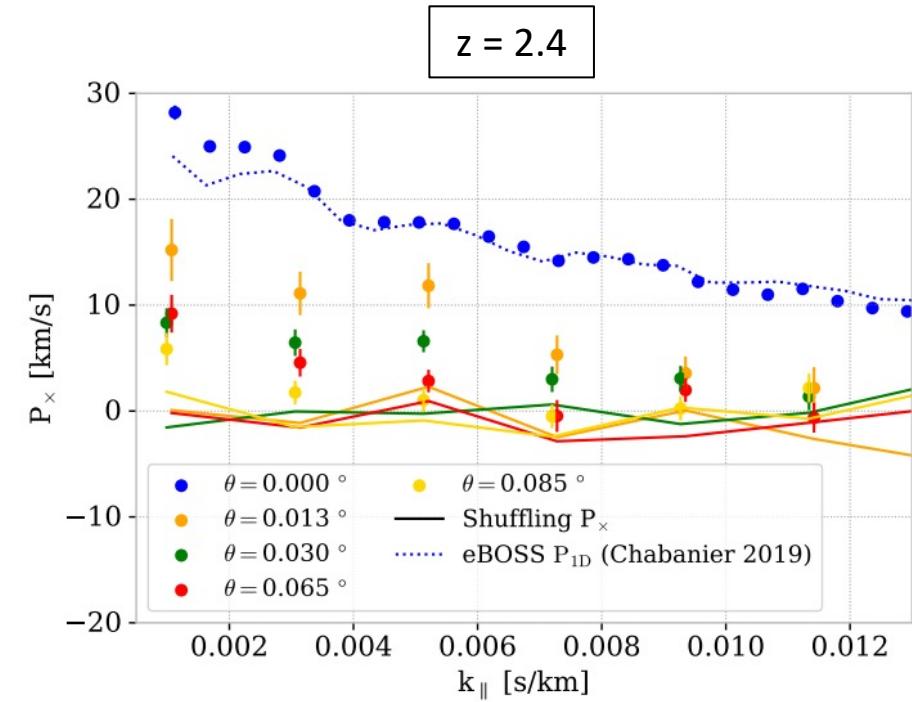
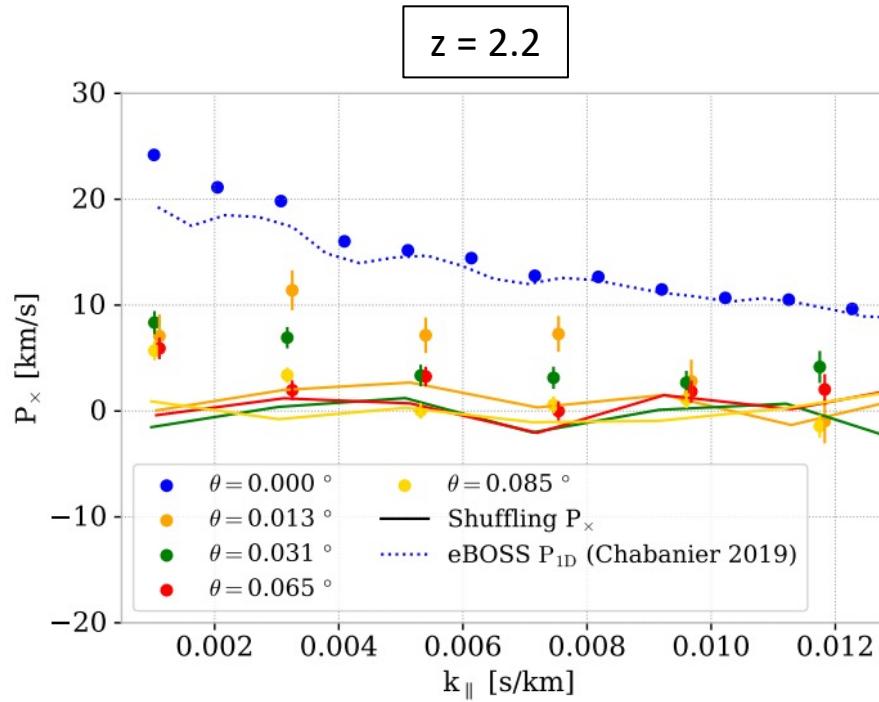
- Low LOS density mock: $N_{\text{LOS}} = 500 \sim \text{eBOSS pair statistics}$
- Noisy mock: adding realistic noise with $\sigma_{\Delta} = 0.5$ for 1 \AA ($N_{\text{LOS}} = 10^4$) $\sim \text{eBOSS}$
- Increase of statistical uncertainties in the measurement



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Proof-of-principle: Application to SDSS quasar spectra

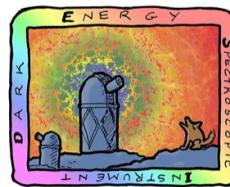


- Use public eBOSS DR16Q catalog
- Reprocess Ly α forest sample:
 - Select corresponding wavelength ranges (z bins)
 - Apply dedicated cuts (SNR, Resolution)

- Pair statistics:

$\langle \theta \rangle (\circ)$	0	0.013	0.03	0.065	0.085
$N(z = 2.2)$	6848	105	329	342	440
$N(z = 2.4)$	3438	28	89	78	104

- Shuffling (null test): cross-correlate LOS with random angular separations

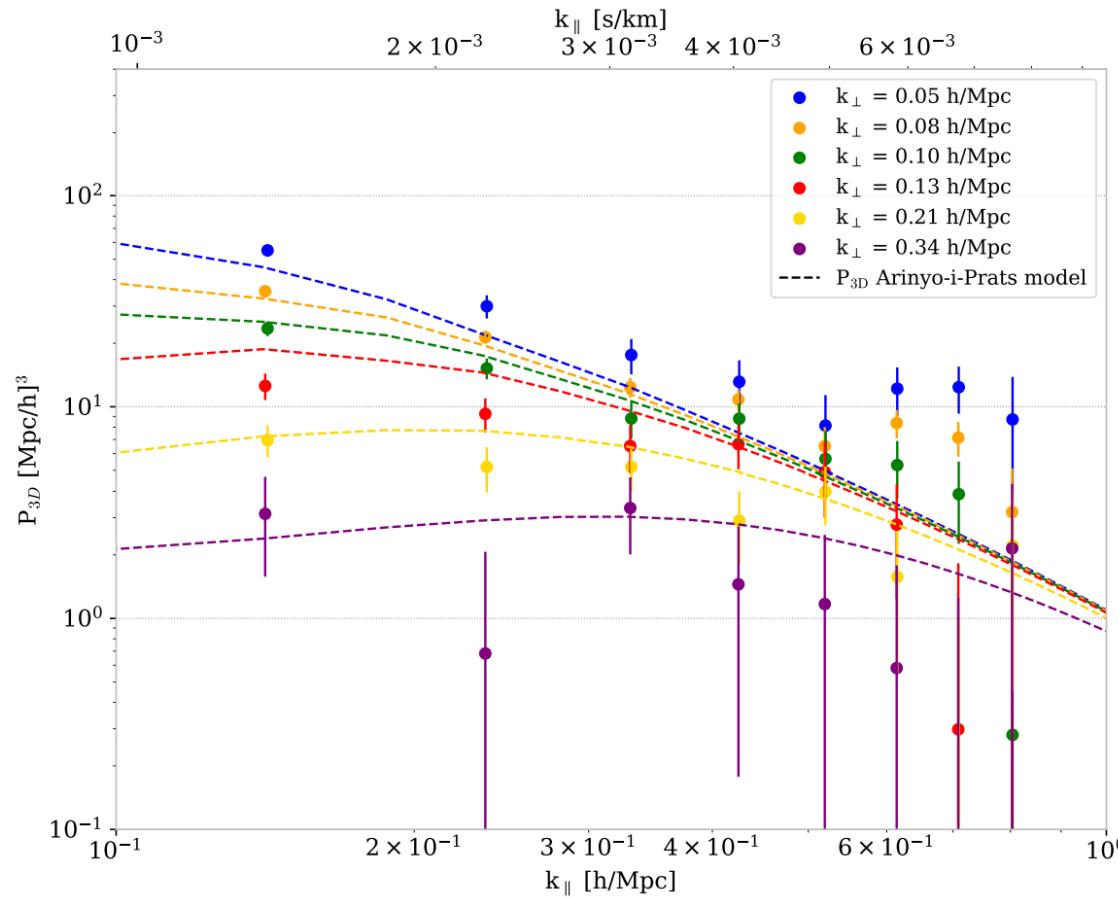


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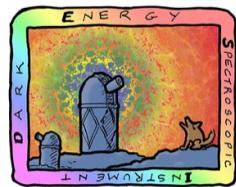
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Proof-of-principle: Application to SDSS quasar spectra

$z \simeq 2.3$



- P_{3D} computed from the statistical combination of $P_x(z = 2.2)$ and $P_x(z = 2.4)$
- For an illustrative purpose: P_{3D} model from Arinyo-i-Prats

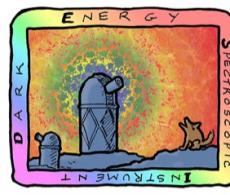


Summary

- Small-scale correlations of Ly α forest are a powerful cosmological tool
- P1D measurement (BOSS/DESI EDR): longitudinal correlations only
- P3D measurement: more challenging, yet to be made
- Fast and simple method to compute P_x and P_{3D}
- Validation on Nyx hydrodynamical simulations
- Proof-of-principle measurement on real data: eBOSS DR16Q

Prospects

- Towards DESI Y1 measurement:
 - Full systematics study on P_{3D} required for DESI ~ expected to be similar to P_{1D}
 - Better pair statistics with DESI Y1
 - Cosmological interpretation



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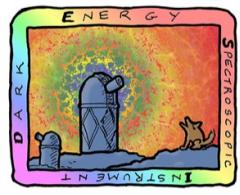
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Thank you !

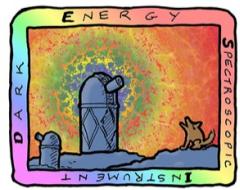
Acknowledgements to Corentin Ravoux, Solène Chabanier, Zarija Lukic

This research used resources of the National Energy Research Scientific Computing Center, a DOE Office of Science User Facility supported by the Office of Science of the U.S. Department of Energy



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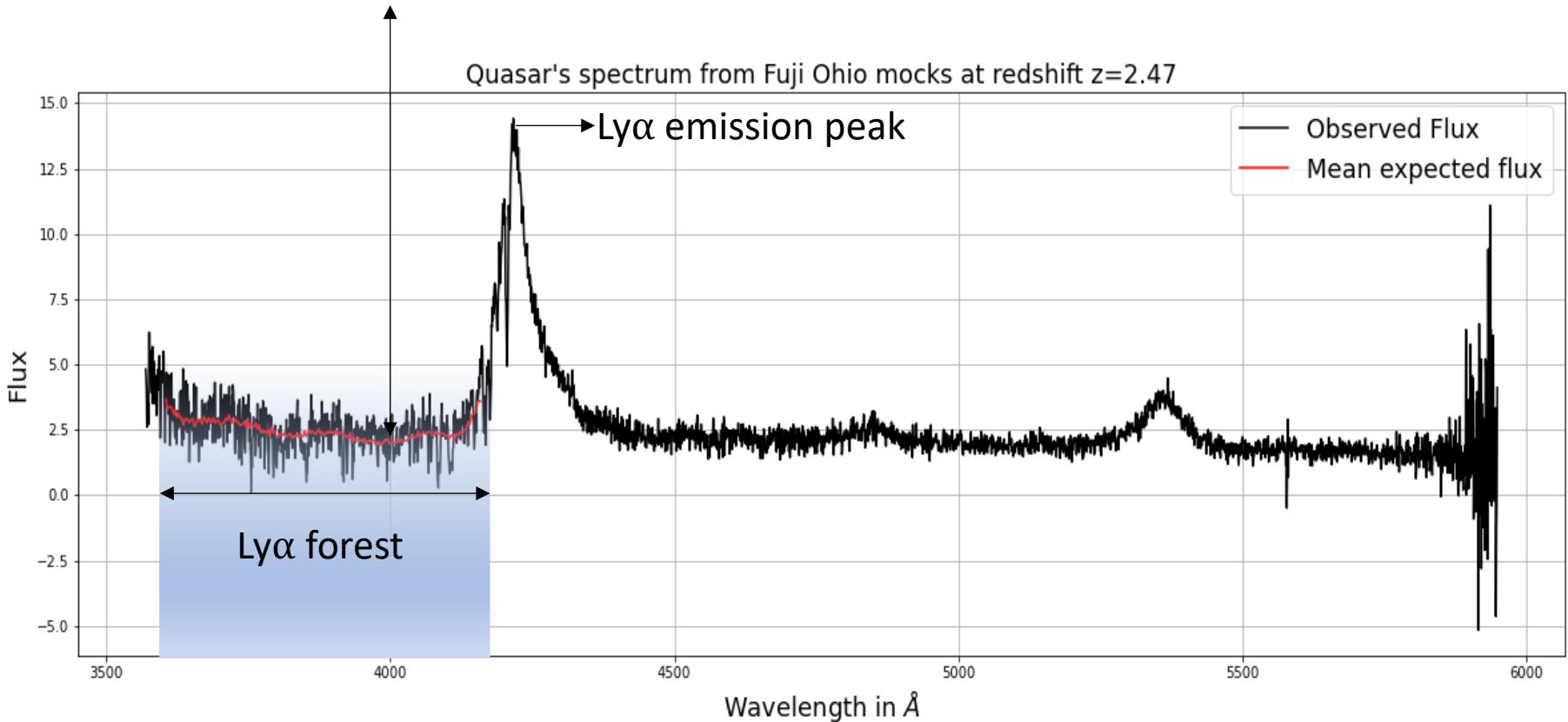
Quasar spectrum

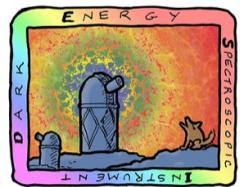
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- Ly α forest range: $1050 < \lambda < 1180 \text{ \AA}$

$$\delta(\lambda) = \frac{f_q(\lambda)}{\bar{F}(z)C_q(\lambda)} - 1 = \delta(\boldsymbol{\theta}, \lambda) = \frac{F(\boldsymbol{\theta}, \lambda)}{\bar{F}(\lambda)} - 1$$

: Represents the fluctuations around the mean expected flux





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Noise and resolution

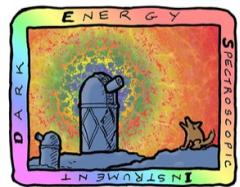
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- For real data, noise and resolution effects must be accounted for:

$$P_{x,\text{Ly}\alpha}(\theta, k_{\parallel}) = \frac{P_x(\theta, k_{\parallel}) - P_n(\theta, k_{\parallel})}{\langle \widetilde{W}_i(k_{\parallel}) \widetilde{W}_j(k_{\parallel}) \rangle}$$

- With the assumption of uncorrelated noise between different LOS:

$$P_n(\theta, k_{\parallel}) = \begin{cases} \langle |\tilde{\delta}_{i,n}|^2 \rangle & \text{if } \theta = 0 \\ 0 & \text{if } \theta > 0 \end{cases}$$



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From P_x to P_{3D}

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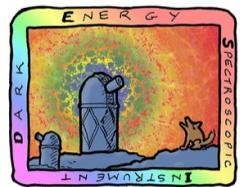
- The computation of P_x enables P_{3D} inference:

$$P_{3D}(z, k_{\perp}, k_{\parallel}) = \int d^2\theta e^{i\theta \cdot \mathbf{k}_{\perp}} P_x(z, \theta, k_{\parallel})$$

- Moving to cylindrical coordinates, 2D \rightarrow 1D integral:

$$P_{3D}(z, k_{\perp}, k_{\parallel}) = 2\pi \int_0^\infty d\theta J_0(k_{\perp}\theta) \theta P_x(z, \theta, k_{\parallel})$$

- Units:
 - Simulations: P_x in $h^{-1} \text{ Mpc}$ and P_{3D} in $[h^{-1} \text{ Mpc}]^3$
 - eBOSS: P_x in km s^{-1} and P_{3D} in $\text{deg}^2 \text{ km s}^{-1}$
 - DESI: P_x in \AA and P_{3D} in $\text{deg}^2 \text{\AA}$



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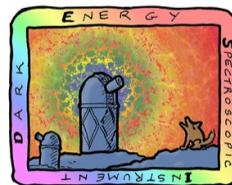
P3D computation

$$P_x(z, \Delta\theta) \equiv \int d\Delta v e^{i\Delta v k_{||}} \xi_{3D}(z, \Delta\theta, \Delta v) = \int \frac{d\mathbf{k}_{\perp}}{(2\pi^2)} e^{i\Delta\theta \mathbf{k}_{\perp}} P_{3D}(z, k_{\perp}, k_{||})$$



$$P_{3D}(k_{\perp}, k_{||}) = 2\pi \int \Delta\theta J_0(\Delta\theta k_{\perp}) P_x(z, \Delta\theta, k_{||}) d\Delta\theta$$

- Choice of \mathbf{k}_{\perp} grid
- For each $(k_{\perp}, k_{||})$ bin: interpolate $P_x(\Delta\theta, k_{||})$ with spline
- Integrate interpolated $P_x(\Delta\theta, k_{||})$ according to the above equation to get $P_{3D}(k_{\perp}, k_{||})$

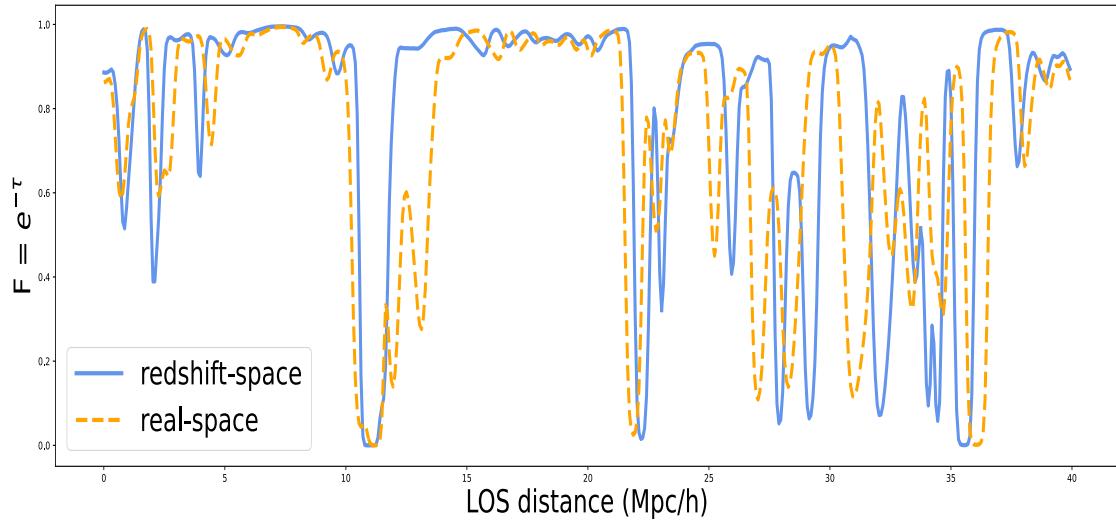
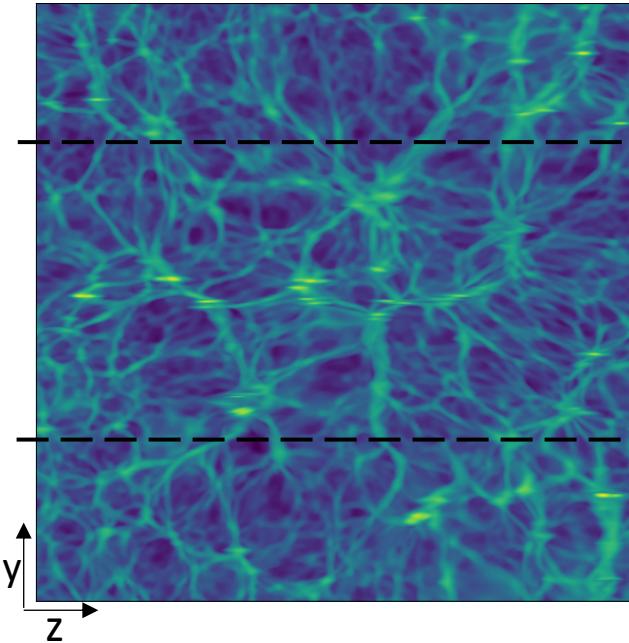


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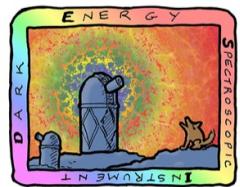
Validation on Nyx box: LOS drawing

$\log \tau_{\text{redshift_space}}$



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

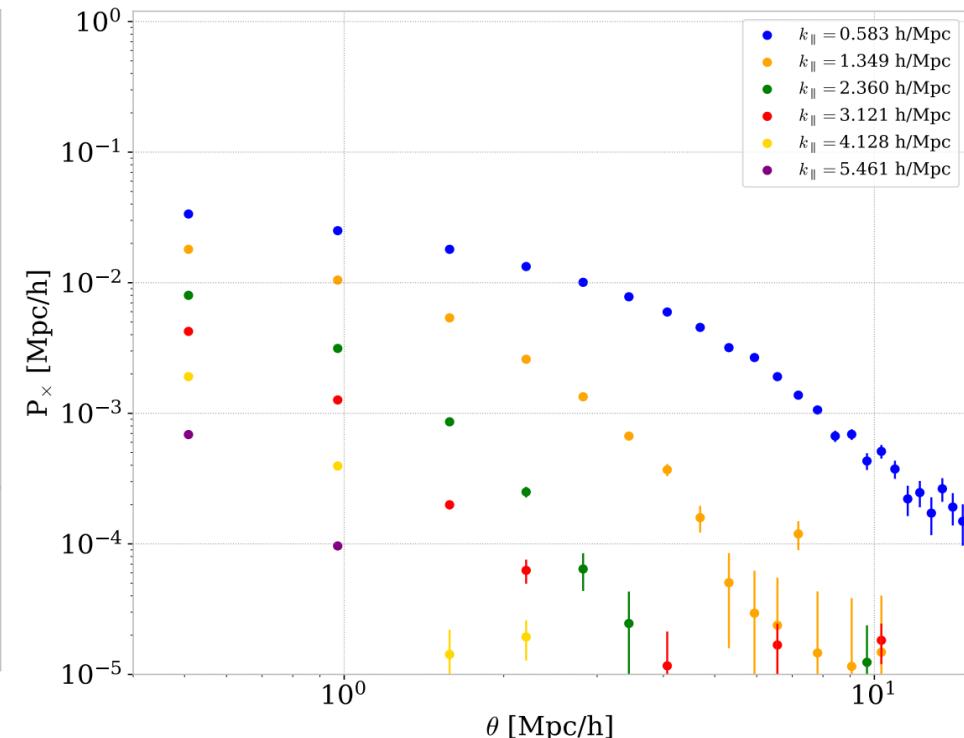
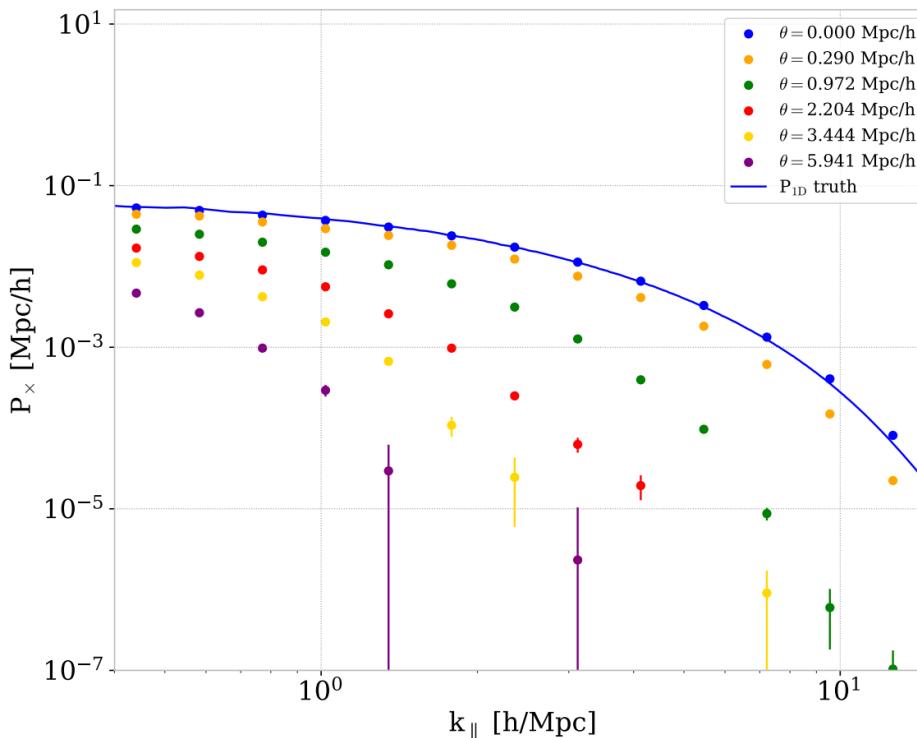
- Draw LOS from box
- Compute the transmitted flux fraction F and mean transmitted flux fraction \bar{F}
- Compute density contrast δ_F



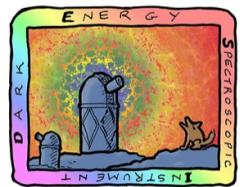
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Results with reference, high density and noiseless mock: P_x



- Reference mock: 10^4 LOS drawn from Nyx box (very high density) without noise
- Overall power decreasing as function of θ
- Small-scale cut off at lower k_{\parallel} as θ increases
- The transverse correlations decrease faster as function of θ at larger k_{\parallel}



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Application to SDSS quasar spectra

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- eBOSS DR16Q: $z > 2.1$ - no BAL - no DLA
- Computation of δ_F using the publicly available pipeline picca
- Two samples:
 - $z = 2.2$: $(\lambda_{\min}, \lambda_{\max}) = (3850, 3930) \text{ \AA}$ - including 38461 Ly α forests with 89 pixels each, spanning a comoving distance of $\sim 59 h^{-1} \text{ Mpc}$
 - $z = 2.4$: $(\lambda_{\min}, \lambda_{\max}) = (4056, 4210) \text{ \AA}$ - including 18653 Ly α forests with 162 pixels each, spanning a comoving distance of $\sim 105 h^{-1} \text{ Mpc}$
- Same resolution correction $W(k_{\parallel}, R)$ as eBOSS – P_{1D}
- SNR cut:
 - $P_x(\theta = 0)$: $\overline{SNR} > 3.9$ at $z = 2.4$ and > 4.1 at $z = 2.2$ as in eBOSS – P_{1D}
 - $P_x(\theta > 0)$: $\overline{SNR} > 1$ for both z bins
- Resolution cut:
 - $P_x(\theta = 0)$: $\bar{R} > 85 \text{ km s}^{-1}$ as in eBOSS – P_{1D}