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BAO from HI intensity mapping: studying the importance of crosscorrelations in the monopole and the quadrupole

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## Our paper (arXiv:2111.11347)

### Baryon acoustic oscillations from H<sub>I</sub> intensity mapping: the importance of cross-correlations in the monopole and quadrupole

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- ✓ Work embedded in SKAO forecasting effort; LSS in Late Universe as new key target for cosmologists.
- ✓ Submitted to MNRAS, currently under peer-reviewing process.
- Direct link to (Cunnington et al. 2020; Soares et al. 2020; Avila et al., 2021; Kennedy, Bull, 2021),
   "Fourier transform" of the latter works.
- ✓ We aknowledge counseling and support to a number of HITS attendants. Paper was written in spite of major threats to scientific collaboration, e.g. COVID-19 waves, England Italy Euro 2020 final...



Baryon matter-radiation coupling, ended at z=1000. Robust, peculiar signal surviving to baryon–DM realignment Standard ruler (~ standard candles). Fit in the power spectrum  $\iff$  constrain  $\Lambda$ CDM model (Eisenstein et al., 2005; Coles et al., 2005)

## Why BAO?



- ✓ So far, discussed from the SKAO (Bacon et al., 2017) and hence of HI IM point of view.
- Soon, complementary technology available (Euclid, optical and infrared spectroscopy, weak lensing, Blanchard et al., 2019) or will be in a longer time horizon.
- In space: Nancy Grace Roman (infrared wide field, BAO measurement, weak lensing, Spergel et al., 2015), SPHEREx (infrared spectro-photometer, f<sub>NL</sub>, HI measurements, Doré et al., 2015).
- On Earth: DESI (spectroscopy, DESI collaboration, 2016), Vera C. Rubin Observatory (optical probing of LSS, LSST Collaboration, 2018)
- Exploit signal complementarities (Wolz et al., 2021): resolution along different axes, min/max redshift, acquisition time, breaking of degeneracies.

## ...In the monopole and the quadrupole (Rubiola, Cunnington, Camera, 2021)

- ✓ Focus on the monopole  $(P_0)$  and the quadrupole  $(P_2)$  in the 0.9-2.0 redshift interval:
  - wide literature and expertise available (Cunnington et al., 2020; Soares et al., 2020)
- ✓ Usual "modular" construction of the full power spectrum. Presence of a compensation factor:  $B_{\rm fg,vol}$ . Volume selection cut-off and excess power removal by PCA at the largest scales, with depletion of cosmological signal

$$P_{\rm HI,g}^{\ell}(k,z) = \frac{2\ell+1}{2} \int_{-1}^{1} d\mu \,\mathcal{L}_{\ell}(\mu) \mathrm{e}^{-k^{2}/2[R^{2}(1-\mu^{2})+\sigma_{r}^{2}\mu^{2}]} b_{\rm HI}(z)\overline{T}_{\rm b}(z)b_{\rm g}(z)P_{\rm m}(k,z) \left[1+\frac{f(z)}{b_{\rm HI}(z)}\mu^{2}\right] \left[1+\frac{f(z)}{b_{\rm g}(z)}\mu^{2}\right] B_{\rm fg,vol}(k,\mu)$$

$$P_{\rm HI,HI}^{\ell}(k,z) = \frac{2\ell+1}{2} \int_{-1}^{1} d\mu \,\mathcal{L}_{\ell}(\mu) \mathrm{e}^{-k^{2}[R^{2}(1-\mu^{2})]} b_{\rm HI}^{2}(z)\overline{T}_{\rm b}^{2}(z)P_{\rm m}(k,z) \left[1+\frac{f(z)}{b_{\rm HI}(z)}\mu^{2}\right]^{2} B_{\rm fg,vol}(k,\mu)$$

## Our recipe

#### WHAT WE NEED

- ✓ Euclid SKAO overlapping z (0.9, 1.35, 2.0); galaxy density as (Blanchard et al., 2019).
- ✓ In the HI map, inject some thermal noise, 10,000 h of single-dish observations, (Bacon et al. ,2019)
- Underlying cosmology and PK: use some of Nbodykit (Hand et al., 2017) and HMF (Murray et al., 2013) features. Introduce BAO via (Eisenstein, Hu, 1998), mimick non-linearity via halofit (Takahashi et al., 2012) prescription.

#### WHAT WE DO

- Log-normal realisations (Coles et al., 1991; Beutler et al., 2011). (2400<sup>2</sup>x600 Mpc/h, grid 400<sup>3</sup>) fixed-volume mocks. Sky fraction decreasing from 12% to 5%.
- ✓ 100 log-normal sims for each z (Villaescusa Navarro et al., 2016).
- ✓ PyGSM (A. de Oliveira-Costa et al., 2008; Zheng et al., 2016) for radio foregrounds contaminating cosmological HI signal.
- ✓ Foreground "blind" removal via PCA (Spinelli et al., 2021; Cunnington et al., 2019), 4 main components detected.
- ✓ Auto- and cross-correlate HI and galaxy maps, extract monopole and quadrupole (Blake, 2019).
- ✓ Extract empirical errors from the sample variances and covariances, to be compared with analytic formulae.

## Fitting template (Villaescusa-Navarro et al., 2016)

$$P_{\rm fit}(k,\mu,z) = P_{\rm nw}(k,\mu,z) + \frac{1}{\alpha_{\perp}^2 \alpha_{\parallel}} \left\{ P_{\rm w} \left[ k \left( \alpha_{\parallel}, \alpha_{\perp} \right), \mu, z \right] - P_{\rm nw} \left[ k \left( \alpha_{\parallel}, \alpha_{\perp} \right), \mu, z \right] \right\},$$
$$P_{\rm null}(k,\mu,z) = P_{\rm nw}(k,\mu,z)$$

$$\Theta = \{ \alpha_{\parallel}, \alpha_{\perp}, b_{\rm g}, b_{\rm HI} \overline{T}_{\rm b}, R, \sigma_{\rm r}, n_{\parallel}, n_{\perp} \}$$

- $\checkmark \sqrt{\Delta \chi}$  with *nw* to assess detection significance
- ✓ Alcock-Paczynski formalism (*Alcock & Pasczynski*, 1979) to evaluate agreement with the reference cosmology ( $\Lambda$ CDM) underlying our sims
- ✓ "Nuisance parameters": bias, beam factors, FG compensations
- ✓ Assign Gaussian analytic uncertainties (Blake,2019)

#### Results: BAO detection in auto- and cross-correlation, monopole qualitative comparison



## Results: BAO detection in $P_0$ and $P_2$ , qualitative comparison

Monopole, auto

Quadrupole, auto





 $\frac{4}{\sqrt{\Delta\chi^2}}$  5

6

Ż

**z** =2.0

8

 $\frac{4}{\sqrt{\Delta\chi^2}}$  5

6

z = 0.9

Ż

8

Ů.

i

2

**2** =1.35

3

2

 $--\cdot \sqrt{\Delta \chi^2} = 3$ 

0

3

# Detection distribution per method and $\ell$ -pole

Method	Redshift	% of realisations – monopole			
		$\geq 3\sigma\;(\leq\chi^2_{0.95})$	$< 3\sigma$	failed	
auto	0.90	78 (76)	19	3	
cross	0.90	99 (92)	1	0	
auto	1.35	50 (43)	46	4	
cross	1.35	59 (31)	38	3	
auto	2.00	25 (14)	71	4	
cross	2.00	50 (43)	46	4	

Method	Redshift	% of realisations – quadrupole			
		$\geq 3\sigma\;(\leq\chi^2_{0.95})$	$< 3\sigma$	failed	
auto	0.90	77 (74)	21	2	
cross	0.90	89 (80)	10	1	
auto	1.35	54 (49)	44	2	
cross	1.35	72 (57)	27	1	
auto	2.00	17 (14)	74	9	
cross	2.00	17 (11)	75	8	

## **Results: SNR and differences in detection**



The signal is better recognisable in the quadrupole, but the SNR tends to favour the monopole, especially at largest scales, Consequences for the detection and the likelyhoods. Definition of hierarchy between cross- and auto – correlation, and z. Competition between the beam damping and the thermal/shot noise levels.



## **Extensions: monopole-quadrupole joint-fit**



## Joint fit detection results

Method	Redshift	% of realisations – joint			
		$\geq 3\sigma \ (\leq \chi^2_{0.95})$	$< 3\sigma$	failed	
auto	1.35	91 (40)	8	1	
cross	1.35	95(38)	4	1	

 $\sqrt{\Delta \chi^2}$  HI-galaxies cross-correlation, joint fit  $\sqrt{\Delta \chi^2}$  HI auto-correlation, joint fit 25 20.0  $17.5 \cdot$ 20  $15.0 \cdot$ 12.5 15 \* 10.0 # 10 7.5 5.02.5 0.0 2.5 5.0 7.5 10.0 12.5 15.0 0.0 2.5 5.0 7.5 10.0 12.5  $\sqrt{\Delta \chi^2}$  $\sqrt{\Delta \chi^2}$ ---  $\sqrt{\Delta \chi^2} = 3$ z =1.35 z = 0.9

15.0

**z** =2.0



- ✓ Stronger constraints: positive impact on the posteriors.
- Higher SNR leads to detections above 10  $\sigma$ .
- ✓ Side effect of additional covariance terms: larger value for the  $\chi^2$

## In conclusion:

- ✓ Good-to-discrete BAO detection in  $P_0 e P_2$  (alone) at low-intermediate z.
- ✓ Additional benefits from joint fit, detection significance ~10 $\sigma$ . Odd(?) covariance effect on  $\chi^2$ .
- $\checkmark$  Very good validation of analytic uncertainties on data.
- ✓ Significance trend decreasing with redshift; auto-correlation alone not completely ruled out
- ✓ AP factors: cosmology-check is feasible on  $\alpha_{\parallel}$ , not excessively correlated with the other parameters. Prior dependence on  $\alpha_{\perp}$  and on  $n_{\perp}$ .
- $\checkmark$  SNR as a main interpretative instrument: margin for volume increase.
- ✓ Difficult but promising task: SKAOxEuclid synergy.
- ✓ Efficient FG-cleaning by means of PCA.
- ✓ Beam effect must be mitigated. Effects of more sophisticated beams?

Thank you for your gentle attention!