### Probing the thermal state of the intergalactic medium at z > 5 with the transmission spikes in high-resolution Ly $\alpha$ forest spectra

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#### ABSTRACT

We compare a sample of high-resolution Ly $\alpha$  forest spectra aimed at spectrally resolving the last remaining transmission spikes at z > 5 with those obtained from mock absorption spectra from the Sherwood and Sherwood-relics suites of hydrodynamical simulations of the intergalactic medium (IGM). We use a profile fitting procedure for the inverted transmitted flux, 1 - F, similar to the widely used Voigt profile fitting of the transmitted flux F at lower redshifts, to characterise the transmission spikes that probe predominately underdense regions of the IGM. We are able to reproduce the width and height distributions of the transmission spikes, both with optically thin simulations of the post-reionization Universe using a homogeneous UV background and full radiative transfer simulations of a late reionization model. We find that the width of the simulated transmission spikes is very sensitive to the instantaneous temperature of the reionized IGM. The width distribution of the observed transmission spikes, which require high spectral resolution ( $\leq 8 \text{ km s}^{-1}$ ) to be resolved, is reproduced for optically thin simulations with a temperature at mean density of  $T_0 = (11000 \pm 1600, 10500 \pm 2100, 12000 \pm 2000)$  K at z = (5.4, 5.6, 5.8). This is weakly dependent on the slope of the temperature-density relation, which is favoured to be moderately steeper than isothermal. In the inhomogeneous, late reionization, full radiative transfer simulations where islands of neutral hydrogen persist to  $z \sim 5.3$ , the width distribution of the observed transmission spikes is consistent with the range of  $T_0$  caused by spatial fluctuations in the temperature-density relation.

**Key words:** cosmology: large-scale structure of Universe - methods: numerical galaxies: intergalactic medium - QSOs: absorption lines

#### 1 INTRODUCTION

The reionization of intergalactic HI and HeI by ultraviolet photons from stars and black holes in the first galaxies is one of the major phase transitions of the universe (Fan et al. 2001, 2006; Robertson et al. 2010; Bolton et al. 2011;

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Planck Collaboration et al. 2014, 2018). Photo-heating during the reionization increases the temperature of the intergalactic medium (IGM) (Hui & Gnedin 1997; Trac et al. 2008; McQuinn et al. 2009; McQuinn & Upton Sanderbeck 2016). The thermal and ionization histories of the Universe are thus interlinked, and can be used in tandem to understand the process of reionization and the nature of ionizing sources (Haehnelt & Steinmetz 1998; Furlanetto & Oh 2009; McQuinn et al. 2011; Becker et al. 2015; Chardin et al. 2017; Davies et al. 2018; Keating et al. 2018; Kulkarni et al. 2019b).

The H<sub>I</sub> Ly $\alpha$  forest observed along sightlines towards bright QSOs is frequently used to constrain the thermal and ionization state of the IGM at z < 5. For underdense or moderately overdense regions, the thermal state of the IGM is often approximated as a power law, parameterised as the temperature at mean density and the slope of the power law ( $T_0$  and  $\gamma$  Lidz et al. 2010; Becker et al. 2011; Rudie et al. 2012; Garzilli et al. 2012; Bolton et al. 2014; Boera et al. 2014; Hiss et al. 2018; Telikova et al. 2018; Walther et al. 2019; Boera et al. 2019). Other relevant parameters are the H<sub>I</sub> photo-ionization rate ( $\Gamma_{\text{HI}}$  Bolton & Haehnelt 2007; Faucher-Giguère et al. 2008; Calverley et al. 2011; Becker & Bolton 2013; Gaikwad et al. 2017a,b; Viel et al. 2017; Khaire et al. 2019) and the pressure smoothing scale (Gnedin & Hui 1998; Peeples et al. 2010; Kulkarni et al. 2015; Lukić et al. 2015; Rorai et al. 2017a). Due to the rapid increase of the Ly $\alpha$  opacity with redshift, the transmitted Ly $\alpha$  flux at z > 5 is close to zero, with the occurrence of a few transmission spikes indicating that the reionization process is inhomogeneous (Becker et al. 2015; Bosman et al. 2018; Eilers et al. 2018). Analysis of the transmission spikes towards ULAS J1120+0641 QSO ( $z_{\rm em} = 7.084$ , Becker et al. 2015; Barnett et al. 2017) with numerical simulations suggests that these spikes correspond to underdense, highly ionized regions of gas (Gnedin et al. 2017; Chardin et al. 2018; Garaldi et al. 2019; Nasir & D'Aloisio 2019). These studies find that the number and height of the spikes are sensitive to the ionization fraction ( $x_{\rm HII}$ ) of the IGM, which in turn depends on the photo-ionization rate and the temperature of the gas in the ionised regions. Perhaps somewhat surprisingly, however, Garaldi et al. (2019) found that the spike shape (especially the widths of the spikes) appeared to be only weakly correlated with the temperature of the IGM. We revisit this question here with a larger sample of higher resolution, higher quality Ly $\alpha$  forest spectra which we compare to high-resolution hydrodynamical simulations of the IGM using the Sherwood and Sherwood-relics simulation suites. These incorporate simulations with a homogeneous UV background as well as full radiative transfer simulations of inhomogeneous reionization (Bolton et al. 2017; Puchwein et al. 2019; Kulkarni et al. 2019b).

There are several difficulties in probing the effect of the thermal state of the IGM on Ly $\alpha$  transmission spikes. High-redshift QSOs, while intrinsically luminous, are nevertheless faint and observed spectra are normally taken at moderate resolution as e.g. offered by VLT/X-Shooter, *i.e.* with 35 km s<sup>-1</sup> or worse. As a result most spectra of high-redshift transmission spikes are of rather modest quality and the number of well observed transmission spikes is necessarily still small due to the rarity and faintness of high-z background QSOs (Kulkarni et al. 2019a). We improve this

situation here and present a sample of 5 high resolution (FWHM  $\sim 6~{\rm km\,s^{-1}}$ ) and high S/N ( $\sim 10$ ) QSO absorption spectra obtained using the Magellan Inamori Kyocera Echelle (MIKE) spectrograph on the Magellan II telescope (Bernstein et al. 2003), and the High-Resolution Echelle Spectrograph (HIRES) on the Keck I telescope (Vogt et al. 1994).

Similarly, simulated transmission spikes may be drawn from simulations with moderate mass or spatial resolution that is only sufficient to produce mock spectra mimicking moderate resolution spectrographs like X-Shooter (35 km s<sup>-1</sup>, but see Garaldi et al. 2019). The thermal smoothing scale of the Ly $\alpha$  transmitted flux due to the IGM temperature  $(T \sim 10^4 \text{ K}, b \sim 13 \text{ km s}^{-1})$  is, however, significantly smaller than this. As discussed in detail by Bolton & Becker (2009), rather high mass or spatial resolution is required to resolve the small scale structure in the underdense regions of the IGM probed by Ly $\alpha$  forest spectra at high redshift. Previous theoretical work has focused focused on analyzing the spikes in radiative transfer simulations (Gnedin et al. 2017; Chardin et al. 2018; Garaldi et al. 2019). While these simulations are physically well motivated, they are computationally expensive and it is hard to disentangle the effect of the thermal state of the IGM on the transmission spikes from the reionization history and numerical limitations.

We have thus chosen to analyze the transmission spikes first in very high resolution, high dynamic range optically thin simulations with different thermal and reionization histories where a single parameter is varied at a time while keeping other parameters fixed. We therefore use simulations from the Sherwood and Sherwood-relics simulation suite (see Bolton et al. 2017; Puchwein et al. 2019, for details) to show how spike properties depend on the IGM thermal state, the H I photo-ionization rate  $\Gamma_{\rm HI}$ , and (in the appendices) the pressure smoothing scale and the mass resolution of the simulations. Once we have established this we investigate the effect of inhomogeneous reionization in more physically motivated, spatially inhomogeneous H I reionization simulations including radiative transfer (see Kulkarni et al. 2019b; Keating et al. 2019).

Another problem when comparing simulated and observed Ly $\alpha$  forest spectra is the accurate characterisation of the transmission spike properties. Transmission spikes are often asymmetric and transmission features appear "blended". The often used simple definition of height and width of spikes based on the maximum and FWHM of the transmitted flux will thus not capture the detailed information contained in the complex spike shapes, and could be the reason that the analyses performed so far show little or no correlations with astrophysical parameters (see e.g. the width vs temperature correlation in Garaldi et al. 2019). Characterizing the shape of transmission spikes becomes even more crucial for high S/N, high resolution QSO absorption spectra. In practice the problem is very similar to that of the characterisation of Ly $\alpha$  absorption lines at lower redshift. To utilise the practical experience gained in this area with existing software packages (e.g. Gaikwad et al. 2017b) we characterize the transmission spikes by fitting Voigt profiles to the "inverted" transmitted flux, 1 - F. We will later show that the fitted parameters obtained in this way are well correlated with physical properties (e.g. the density and temperature) of the gas associated with the

transmission spikes. We will also study how the statistics of the fitted parameters depend on the astrophysical parameters  $\Gamma_{\rm HI}$ ,  $T_0$  and  $\gamma$ . Unlike for absorption lines, there is no physical motivation for the fitting Voigt profiles to spikes, so this should be considered as a purely heuristic approach to comparing simulated and observed spectra.

The main goal of this paper is to constrain the thermal state of the IGM at  $5.3 \le z \le 5.9$ . The paper is organized as follows: In §2 we give a qualitative and theoretical analysis of the occurrence of Ly $\alpha$  transmission spikes. We present the properties of transmission spikes in optically thin simulations in §3 and §4. We demonstrate the sensitivity of spike statistics to the IGM thermal state in §5. The main results of the paper are presented in §5.3 and §6 by comparing the observed spike statistics with those from optically thin and radiative transfer simulations. We summarize our findings in §7. We assume a flat  $\Lambda$ CDM cosmological model  $(\Omega_{\Lambda}, \Omega_{m}, \Omega_{b}, \sigma_{8}, n_{s}, h, Y) \equiv$ (0.692, 0.308, 0.0482, 0.829, 0.961, 0.678, 0.24)consistent with Planck Collaboration et al. (2014, 2018). All distances are given in comoving units unless specified.  $\Gamma_{\rm HI}$  expressed in units of  $10^{-12}$  s<sup>-1</sup> is denoted by  $\Gamma_{12}$ .

# 2 TRANSMISSION SPIKES IN HIGH-RESOLUTION, HIGH-REDSHIFT Ly $\alpha$ FOREST SPECTRA

#### 2.1 High-resolution spectra of transmission spikes

The data consist of the high resolution echelle spectra of five recently discovered bright z > 6 QSOs. Table 1 gives the name of each object, the emission redshift  $z_{\rm em}$ , the total exposure time T in hours, and the signal-to-noise ratio per pixel. The objects were observed under mostly photometric conditions in sub-arcsec seeing. The first four objects were observed with the MIKE instrument (Bernstein et al. 2003) on the Magellan II telescope at Las Campanas Observatory. A 0.5" wide slit gave a measured spectral resolution of 5 km s<sup>-1</sup> (FWHM). The spectra were binned onto 2 km s<sup>-1</sup> wide pixels. The spectrum of SDSSJ010013.02+280225.8 was obtained with the HIRES instrument (Vogt et al. 1994) on the Keck I telescope, and a 0.861" wide slit, giving a resolution of 6.1 km s<sup>-1</sup> (FWHM), sampled by 2.5 km s<sup>-1</sup> wide bins. The data were reduced with a custom pipeline (Becker et al. 2012). Optimal sky-subtraction on the individual, un-rectified exposures was performed according to the prescription by Kelson (2003).

To obtain a continuum model, a power law fit was applied to continuum regions redward of the Ly $\alpha$  emission line in flux-calibrated, low resolution spectra of each QSO, as the high resolution spectra only had limited coverage in the red. The continuum was then scaled to match to the flux-calibrated high resolution spectrum in the overlap region with the low-resolution spectrum, and divided into the spectrum. To correct for the rapidly variable region of the spectrum near the Ly $\alpha$  emission line, the emission line region was fitted with a higher order polynomial in the previously continuum divided spectrum, which then was multiplied into the previous continuum fit. The final continuum thus obtained was divided into the data. As we show later, the width of the transmission spikes are relatively robust to continuum fitting uncertainty.

One-sigma error files were propagated from the original data frames. When adding and rebinning the observed exposures, the data become smoothed and the root-mean-square (RMS) fluctuations in the pixel flux become smaller than suggested by the original error array. The ratio between error and RMS values is a number close to unity varying slowly with wavelength. To obtain a valid goodness-of-fit criterion with a reduced  $\chi^2_{\nu} \sim 1$ , an array containing a correction factor consisting of the ratio (propagated error)/(RMS in the final data) was derived and divided into the error array when fitting.

### 2.2 Characterising width and height of individual components

Fig. 1 compares an example of transmission spikes in a highresolution Ly $\alpha$  forest observation with the MIKE spectrograph to simulated spectra drawn from the Sherwood-relics simulation suite (Puchwein et al. 2019, and see also Section 3.1), for cold and hot models with a spatially uniform UV background. The transmission spikes have complex shapes composed of many asymmetric and blended features. Even isolated transmission spikes are often highly asymmetric and consist of two or more "components". In order to facilitate a more quantitative discussion of the transmission spikes, we focus on two properties, namely the height and width of individually identifiable components. We quantify these (see §4) by fitting the "inverted" transmitted flux, 1 - F, with multi-component Voigt profiles, similar to the fitting of Voigt profiles of the transmitted flux, F, often employed at lower redshift to characterise absorption lines.

The best fits to observed and simulated spectra are shown in Fig. 1 by the red curve. The location of individual identified components are marked by black vertical lines. Fig. 1 show simulated spectra for the hot and cold model and illustrate the sensitivity of spike features to the thermal state of the IGM. In general, the spikes in the hot model are (i) broader, (ii) lower in height, (iii) more asymmetric and (iv) less blended (hence fewer in number) than those in the corresponding cold model. It is interesting to note that the number and shape of the spikes in the hot model are qualitatively very similar to those in the observed spectra. We will analyse this more quantitatively later.

#### 2.3 The origins of transmission spikes

The complex shapes of the transmission spikes shown in the last section will be a superposition of features in the line-ofsight distribution of density, temperature, photo-ionization rate and peculiar velocity. To get a better feel for this in Fig. 2 we show mock spectra where we isolate the effect of varying these parameters, one at a time. Fig. 2 illustrates how the variation in any of these physical quantities along a sightline can lead to regions of smaller HI optical depth and hence transmission spikes. Panels A1-A6, B1-B6 and C1-C6 show the effect of underdensity, enhanced  $\Gamma_{\rm HI}$  and enhanced temperature along a sightline, respectively. All these effects can result in a smaller number density of neutral hydrogen, n<sub>HI</sub>, along the sightline. Panels D1-D6 show that a diverging peculiar velocity field along the sightline can also produce transmission spikes. Hot, ionized underdense regions subjected to high photo-ionization rates and diverging peculiar

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Table 1. Properties of the QSO spectra analysed in this work (see text for further details).

ID	Name	$z_{ m em}$	T[h]	(S/N)/pixel	Reference	Instrument	Dates of the observations
1	ATLASJ158.6938-14.4211	6.07	11.8	7.7	Chehade et al. (2018)	MIKE	March and April, 2018
2	PSOJ239.7124-07.4026	6.11	10.0	6.5	Bañados et al. (2016)	MIKE	March, April and June,2018
3	ATLASJ025.6821-33.4627	6.34	6.7	12.0	Carnall et al. (2015)	MIKE	October and December, 2018
4	J043947.08+163415.7	6.51	10.0	30.3	Fan et al. (2019)	MIKE	October and December, 2018
5	SDSSJ010013.02+280225.8	6.30	5.0	20.0	Wu et al. (2015)	HIRES	November 2017

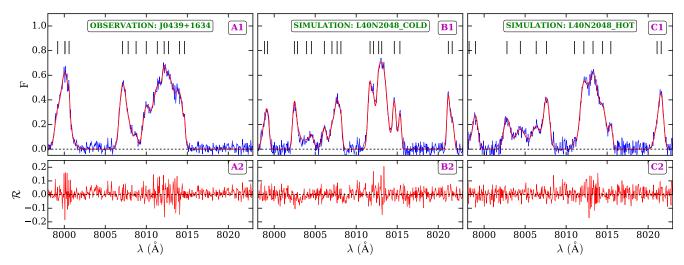


Figure 1. Examples of transmission spikes from observed spectra (panel A1) and simulated spectra from cold (panel B1) and hot (panel C1) optically thin simulations drawn from the Sherwood-relics simulation suite. The widths and heights of the spikes are sensitive to the thermal and ionization state of the IGM. The shape and number of spikes in the observed spectra are similar to the simulated spectra from the hot model. The resolution and noise properties of the simulated spectra are chosen to match the observed spectra. As described in the main text we fit the "inverted" transmitted flux, 1 - F, with multi-component Voigt profiles using the software package VIPER (Gaikwad et al. 2017b). The top panels show the input spectra (F), blue solid curve) and fitted spectra (F), in red solid curve). The black solid lines mark the location of the centres of Voigt components identified and fitted by VIPER. The bottom panels show that the residuals between the input and fitted spectra are random and less than 11 per cent. The number of components identified in the cold model is larger than in the hot model due to the smoother transmitted flux distribution.

velocities will thus produce the most prominent transmission spikes in high–z QSO absorption spectra (Gnedin et al. 2017; Chardin et al. 2018; Garaldi et al. 2019). The transmission spikes shown in Fig. 2 are by construction isolated, symmetric and simple. As discussed in the previous section, transmission spikes in both observed spectra and spectra drawn from cosmological hydrodynamical simulations have complicated shapes, as generally more than one of the above effects contribute.

#### 3 TRANSMISSION SPIKES IN OPTICALLY THIN SIMULATIONS

### 3.1 The Sherwood and Sherwood-relics simulation suites

We use cosmological hydrodynamical simulations from the Sherwood-relics simulation suite to investigate transmission spikes in the high-redshift Ly $\alpha$  forest; see Table 2 for an overview (Puchwein et al. 2019). The simulations were performed with a modified version of the P-GADGET-3 code (itself an updated version of the GADGET-2 code presented in Springel 2005). The code uses a tree-particle mesh gravity solver for following cosmic structure formation and a manifestly energy and entropy-conserving smoothed particle hy-

drodynamics scheme (Springel & Hernquist 2002) for following the hydrodynamics. The Sherwood-relics simulations build upon the original Sherwood simulation suite (which is used in Appendix C to study numerical convergence) in that the initial conditions were generated in the same way, and much of the modelling of the IGM and Ly $\alpha$  forest is based on similar methods (Bolton et al. 2017)<sup>1</sup>.

Our main production runs follow  $2\times 2048^3$  particles in a  $(40\,h^{-1}\,{\rm cMpc})^3$  volume, corresponding to a gas mass resolution of  $9.97\times 10^4\,h^{-1}\,{\rm M_\odot}$ . For the gravitational softening we adopt  $0.78\,h^{-1}\,{\rm ckpc}$ . Star formation is treated with a rather simplistic but numerically efficient scheme in which all gas particles with densities larger than 1000 times the mean cosmic baryon density and temperatures smaller than  $10^5$  K are converted to collisionless star particles. While this does not produce realistic galaxies, it allows robust predictions of the properties of the IGM (Viel et al. 2004a). Photoheating and photoionization are followed based on external UV background models. In a departure from the Sherwood simulations, we use a non-equilibrium ionization and cooling/heating solver (Puchwein et al. 2015; Gaikwad et al. 2019) for following the thermochemistry of hydrogen and he-

<sup>1</sup> https://www.nottingham.ac.uk/astronomy/sherwood/

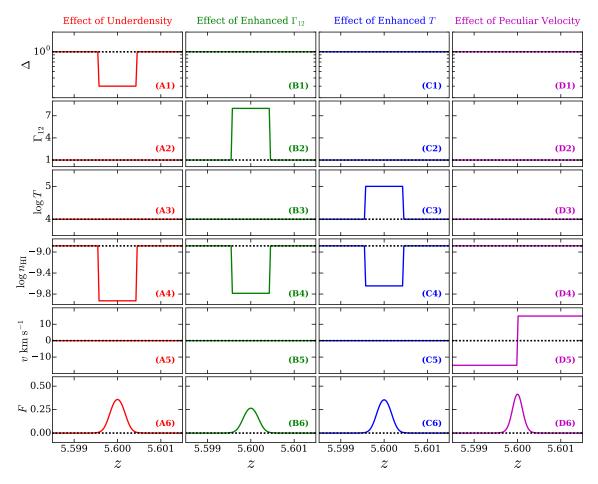


Figure 2. Illustration of the origin of transmission spikes due to the variation of individual physical parameters. Each row displays the variations in line of sight density ( $\Delta$ ), H<sub>I</sub> photo-ionization rate ( $\Gamma_{12}$ ), temperature (T), H<sub>I</sub> number density ( $\tau_{12}$ ), peculiar velocity ( $\tau_{12}$ ) and transmitted Ly $\tau_{12}$  flux,  $\tau_{12}$ . The black dashed lines show the default values. In each column, a different physical parameter is varied. In the first three columns (i.e. for varying  $\tau_{12}$  and  $\tau_{12}$ ) the occurrence of spikes is due to a change in  $\tau_{11}$ . Panels D1-D6 instead shows the formation of a transmission spike due to a diverging velocity flow along the sightline while  $\tau_{11}$  remains constant. Realistic transmission spikes (see Fig. 4), have more complicated shapes and will be due to a combination of these effects.

lium. This ensures that no artificial delay between the reionization of gas and its photoheating is present. We have also replaced the slightly modified Haardt & Madau (2012) UV background used in Sherwood with the fiducial UV background model from Puchwein et al. (2019) in our default run. This results in a more realistic reionization history with hydrogen reionization finishing at  $z\approx 6.2$ . The cold/hot models were obtained by decreasing/increasing the H I and He I photoheating rates in the fiducial UV background model by a factor of 2 and the He II photoheating rate by a factor of 1.7, while keeping all photoionization rates fixed. Mock Ly $\alpha$  forest spectra were extracted from all simulations as described in Bolton et al. (2017) (see also Gaikwad et al. 2018, 2019).

## 3.2 The temperature density relation (TDR) in optically thin simulations

Fig. 3 shows the TDR in the *hot* and *cold* models of the Sherwood-relics simulation suite. We shall compare the *hot* and *cold* models to study the effect of temperature on transmission spikes. Note that the *hot* model is not only hotter

than the *cold* and the *default* model but also has a flatter temperature density relation, and that the ionization state of the gas is also different in the models. This is because the recombination coefficient is temperature dependent. For the same photo-ionization rate the H<sub>I</sub> fraction is therefore smaller in the *hot* model. The models *aton* and *patchy* incorporate the effect of inhomogeneous UV background that we describe later.

## 3.3 Examples of transmission spikes in the hot and cold optically thin simulations

Fig. 4 shows the relevant physical properties along the two sightlines in the hot and cold models. As expected, the hot model shows (i) a smoother density ( $\Delta$ ) field in real space, (ii) a smaller H I fraction ( $x_{\rm HI}$ ), (iii) a larger temperature (T) and (iv) a smoother velocity (v) field compared to the corresponding cold model. The smoothing of the real-space density field and the velocity field can be attributed to the increased effect of pressure smoothing in the hot model. The resultant Ly $\alpha$  optical depth and transmitted flux calculated from the  $\Delta$ ,  $x_{\rm HI}$ , T and v fields are shown in panels A6-B6

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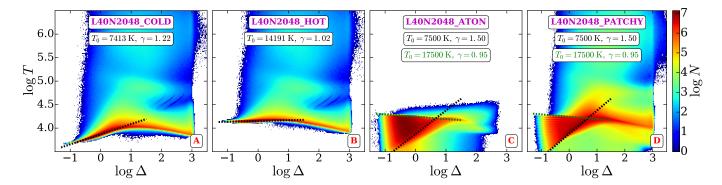


Figure 3. Comparison of the temperature-density relation (TDR) in the cold (panel A), hot (panel B), aton (panel C) and patchy (panel D) simulations at z=5.8. The cold and hot models correspond to the optically thin Sherwood-relics simulations. The aton simulation is post-processed with the radiative transfer code ATON, while the patchy simulation includes the effect of pressure/Jeans smoothing as well as the shock heating of the gas. For optically thin simulations the TDR in underdense and moderately overdense regions can be approximated as a power-law relation ( $T=T_0 \Delta^{\gamma-1}$ ) at  $\Delta \leq 10$ . The best-fitting relation in the cold and hot models is shown by the black dashed lines. By construction, the temperature of the gas with  $\Delta \leq 10$  in the hot model is consistently larger than that in the cold model. As a result, the height and width of the transmission features are expected to be different in the hot and cold models. Unlike the optically thin simulations, the radiative transfer simulations (aton and patchy) do not exhibit a single power-law TDR at  $\Delta \leq 10$ . For visual purposes, we show two power-laws that cover the range in temperature for the radiative transfer runs (panel C and D). The absence of gas with T > 30000 K in aton is because the shock heating is not captured self-consistently in the aton runs. It is also interesting to note that the number of gas elements (at  $\Delta \leq 10$ ) between the two straight power law TDR lines is larger in the aton simulations than in the patchy simulations. The transmission spikes are therefore expected to be slightly broader in the aton than in the patchy simulations (see Fig. 7). Note that gas with  $\Delta > 10^3$  and  $T < 10^5$  K has been converted into stars in all these simulations (Viel et al. 2004a). We discuss the TDR for optically thin and radiative transfer simulations in §3.2 and §6.2, respectively.

Table 2. Origin of transmission spikes due to variation in physical parameters in our simulations at 5.5 < z < 5.7 (as shown in Fig. 2).

	Fraction of spikes (in per cent) showing the effect						
Simulation	$Underdensity^{[a]}$	Enhanced $\Gamma_{\rm HI}$ [b]	Enhanced $T^{[c]}$	Peculiar velocity <sup>[d]</sup>			
L40N2048_DEFAULT	89.1	0.0	5.7	18.8			
$L40N2048\_COLD$ [e]	89.3	0.0	4.9	14.8			
$L40N2048\_HOT$ [e]	89.8	0.0	5.5	19.9			
L40N2048_ATON	84.4	56.8	50.1	19.5			
L40N2048_PATCHY	79.2	54.7	40.3	18.4			

<sup>&</sup>lt;sup>a</sup> Fraction of all spikes with  $\Delta_{\tau} \leq 1$ .

and panels A7-B7, respectively. Note that the location of spikes in the green and yellow shaded regions in redshift space differs in real space due to the effect of peculiar velocities. The transmission spikes in the *hot* and *cold* models have complicated shapes, qualitatively similar to that in the observed spectra (Fig. 1). The smoother transmission features in the simulated spectra of the hot model are more similar to those in the observed spectra than those in the more "spiky" spectra in the *cold* model.

In both models, the transmission spikes correspond to regions of low H I optical depth ( $\tau_{\rm HI} \leq 4$ , black dashed line). The peaks in transmission are well correlated with those in

the optical depth weighted overdensities  $(\Delta_{\tau} < 0.8)$ .<sup>2</sup> It is clear from Fig. 4 that the spikes in the *hot* model are smoother, broader and more prominent than in the *cold* model. Furthermore the number of individual transmission components is significantly smaller in the *hot* model than in the *cold* model due to the "thermal blending" of transmission features. The shape and number of transmission spikes in our simulated spectra are clearly sensitive to the thermal

<sup>&</sup>lt;sup>b</sup> Fraction of all spikes with  $\Gamma_{\rm HI} \geq \Gamma_{\rm HI, median}$  where  $\Gamma_{\rm HI, median}$  is the optical depth weighted median  $\Gamma_{\rm HI}$  calculated from all the sightlines (i.e., regions with and without spikes).

<sup>&</sup>lt;sup>c</sup> Fraction of all spikes with  $T_{\tau} \geq T_{\tau,\text{median}}$  where  $T_{\tau,\text{median}}$  is the optical depth weighted median temperature calculated from all the sightlines (i.e., regions with and without spikes).

d Fraction of all spikes with  $\Delta v \geq 6~{\rm km\,s^{-1}}$  where  $\Delta v$  is difference between mean velocity on redward and blueward side of spike center. For diverging velocity flow  $\Delta v > 0$ , whereas for converging velocity flow  $\Delta v < 0$ . The limit of  $\Delta v = 6~{\rm km\,s^{-1}}$  corresponds to the spectral resolution of the instrument.

 $<sup>^{\</sup>rm e}$  L40N2048\_COLD  $\,$  and L40N2048\_HOT  $\,$  are optically thin simulations that do not include fluctuations in  $\Gamma_{\rm HI}.$ 

 $<sup>^2~\</sup>Delta_{\tau}$  accounts for the redshift space effect of peculiar velocity on  $\Delta.$ 

and ionization state of the IGM in a manner that we will quantitatively discuss later.

Table 2 shows the physical effects responsible for the occurrence of transmission spikes in the optically thin hot and cold simulations. Most of the spikes ( $\sim$  89 percent) in the hot and cold models occur in underdense regions. Around 15 percent of spikes show a diverging velocity field along the sightline. The effect of enhanced temperature on the occurrence of transmission spikes is marginal in both hot and cold optically thin simulations.

In summary, Fig. 4 and Table 2 show that underdense ( $\Delta_{\tau} < 0.8$ ), more highly ionized (minimum in  $x_{\rm HI}$ ) and hotter regions along a sightline produce more prominent spikes. This motivates us to quantify the shape of spikes and to introduce statistics that are sensitive to the thermal and ionization parameters of the IGM.

#### 4 CHARACTERISING THE PROPERTIES OF TRANSMISSION SPIKES IN OPTICALLY THIN SIMULATIONS

#### 4.1 Voigt profile fitting of the inverted flux 1 - F

The shape of absorption features is usually characterized by Voigt profiles defined by three parameters: (i) the centre of absorption lines ( $\lambda_c$ ), (ii) the H<sub>I</sub> column density ( $N_{\rm HI}$ ) and (iii) the width of the absorption (b) features. Most of the absorption features in the high-z (z  $\sim$  6) Ly $\alpha$  forest are saturated  $(F \sim 0)$  and strongly blended. It is well known that Voigt profile decompositions are highly degenerate for saturated lines and very sensitive to systematic errors due to continuum fitting and treatment of noise properties (Webb & Carswell 1991; Fernández-Soto et al. 1996). The inverted transmitted flux, 1 - F, however, becomes similar in appearance to the absorption features in the Ly $\alpha$  forest at lower redshift, where Voigt profile fitting is much less problematic. For convenience, we have thus fitted Voigt profiles to 1 - F, building on existing experience with Voigt profile decomposition of complex blended spectral profiles. At the redshift we consider here the transmission spikes are not saturated, so effectively we use our VoIgt profile Parameter Estimation Routine (VIPER Gaikwad et al. 2017b) to fit multi-component Voigt profiles to the transmission profiles. Similar to absorption lines, a simple, isolated and symmetric spike is fitted by 3 parameters: (i) a spike centre ( $\lambda_c$ ), (ii) the logarithm of the pseudo-column density (denoted by  $\log N_{\rm HI}$ ) and (iii) a spike width (b). The pseudo-column density is thereby a measure of the deficiency of HI along the sightline where the spike occurs. For example, a larger value of log N<sub>HI</sub> means a large H<sub>I</sub> deficit hence a more prominent spike. Our measured  $\log N_{\rm HI}$  are sensitive to the H<sub>I</sub> photo-ionization rate  $\Gamma_{\rm HI}$ . The interpretation of the other two parameters i.e.,  $\lambda_c$  and width of the spikes remains unchanged when we fit 1-F. As we show later, the distribution of spike widths is sensitive to the thermal state of the IGM and can be used to constrain the temperature of the IGM.<sup>3</sup>

Our main aim is to use the distribution of spike widths

to constrain the thermal state of the IGM. As we will show later, these are much less sensitive to IGM ionization state and continuum fitting uncertainties than the heights of the spikes. Note that we rescale the optical depth in different models to match observations (rescaling is not applied in Fig. 4). We show such rescaling does not significantly affect the widths of the line in Appendix A.

### 4.2 The physical properties of the gas probed by transmission spikes

### 4.2.1 The dependence of spike height on density: $\Delta_{\tau}$ vs $\log \widetilde{N}_{HI}$

We now turn to connecting the observed spike shapes to optical depth weighted physical properties of the IGM in the optically thin simulations (see Eq. 12 in Gaikwad et al. 2017a). In Fig. 5, we show the optical depth weighted overdensity against spike height as measured by (pseudo) column density  $\log \tilde{N}_{\rm HI}$  for the cold and hot models. In both models the corresponding overdensity of spikes is  $\Delta_{\tau} < 1$  i.e., most of the spikes occur in underdense regions. Note that applying a rescaling of optical depth to correct for the uncertain amplitude of the UV background results in a systematic increase or decrease of  $\log \tilde{N}_{\rm HI}$ . However, the overdensities corresponding to spikes are relatively robust. This is also evident from Fig. 4, where the spikes in the hot and cold models correspond to similar overdensities (rescaling is not applied in Fig. 4).

Fig. 5 also illustrates that  $\log \widetilde{N}_{\rm HI}$  and  $\Delta_{\tau}$  are anti-correlated i.e. a larger spike height and higher H I pseudo-column density corresponds to smaller overdensity  $\Delta_{\tau}$ . We quantify the degree of anti-correlation by fitting a straight line of the form  $\Delta_{\tau} = \Delta_0 \left[\widetilde{N}_{\rm HI} / 10^{12.8}\right]^{\beta}$ . The normalization  $(\Delta_0 = 0.24$  for cold and 0.26 for hot) and slope  $(\beta = -0.23$  for cold and -0.20 for hot) of the correlation in the two models are in good agreement with each other. This suggests that the thermal state of the gas does not have a strong effect on the  $\Delta_{\tau} - \log \widetilde{N}_{\rm HI}$  correlation when optical depths are rescaled to match observations. Note, however, that the scatter in  $\Delta_{\tau}$  for a given  $\log \widetilde{N}_{\rm HI}$  (e.g., at  $\log \widetilde{N}_{\rm HI} \sim 12.6$ ) correlation is smaller in the hot model. This is because the spikes are smoother and hence there is less variation in  $\Delta_{\tau}$ .

### 4.2.2 The dependence of spike width on temperature: $T_{\tau}$ vs log b

The spike widths are sensitive to the instantaneous temperature along the sightline (see Fig. 1 and Fig. 4). Fig. 6 shows the correlation of optical depth weighted temperature ( $T_{\tau}$ ) with spike width (b) for the cold and hot model. The range in temperature associated with spikes is small for both models. This is expected as the slope of the TDR (Fig. 3) for both models is relatively flat and the temperature associated with  $\Delta < 1$  is relatively constant.

Fig. 6 illustrates that the spike widths are well correlated with temperature. The spike widths are systematically larger in the hot model (log  $b \sim 1.3$ ) compared to the cold model (log  $b \sim 1.05$ ). Even though the range in temperature is small ( $\delta T_{\tau} \sim 0.1$ ) for both models, the scatter in log b is relatively large ( $\delta$  log  $b \sim 0.5$ ). In §5.4 we will use the spike width distribution to constrain the temperature of the IGM.

 $<sup>^3</sup>$  Unlike for absorption lines, there is no direct relation between temperature of the absorbing gas and the width of the spikes, such that  $b_{\rm spike} \neq \sqrt{2k_{\rm B}T/m}$ .

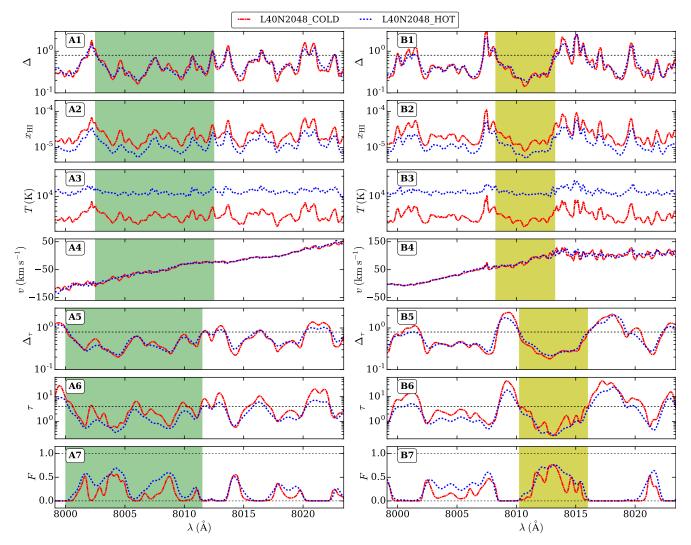


Figure 4. Examples of transmission spikes in optically thin simulations showing the complex structure of the spikes and the dependence on the thermal state of IGM. The figure shows a line of sight comparison of overdensity ( $\Delta$ , panel A1), H I fraction ( $x_{\rm HI}$ , A2), temperature (T, A3), peculiar velocity (v, A4), optical depth weighted overdensity ( $\Delta_{\tau}$ , A5), H I Ly $\alpha$  optical depth ( $\tau$ , A6) and transmitted Ly $\alpha$  flux (F, A7) for the cold (red dot-dashed curve) and the hot (blue dotted curve) optically thin simulations. Panel B1-B7 are the same as panel A1-A7 along a different line of sight. The shaded region in panels A7 and B7 show the complex shapes of the spikes in regions where the optical depth is lowest ( $\tau_{\rm HI} \leq 4$ , black dashed line in panel A1, A5, A6, B1, B5 and B6). The shapes of the spikes are smoother in the hot model due to the larger temperature (Panel A3 and B3) and smoother density field (panel A1 and B1) than those in the cold model. As a result, the number of components identified by VIPER is smaller in the hot model. The transmission spikes also reach larger fluxes in the hot model due to the dependence of the H I fraction (panel A2 and B2) on temperature (via the recombination rate). The shift of the shaded region in panels A1-A4 (B1-B4) as compared A5-A7 shows the effect of peculiar velocity on the transmission spikes. The spikes in the simulated spectra occur due to a combination of the effects of underdensity, temperature enhancement and peculiar velocity as shown in Fig. 2 ( $\Gamma_{12}$  is uniform in the optically thin simulations). The mean transmitted flux has not been rescaled for hot and cold model in the above examples.

### 4.2.3 The correlation of spike width and height: $\log b$ vs $\log \widetilde{N}_{\rm HI}$

The relation of absorption line widths with column density and its relation with the thermal state of the gas at z < 4 has been widely discussed in the literature (Schaye et al. 1999; Bolton et al. 2014; Gaikwad et al. 2017b; Rorai et al. 2017b, 2018; Hiss et al. 2018, 2019). The equivalent relation for the Voigt profile parameters of the transmission spikes in our simulated spectra is compared in Fig. 7 to the observed spectra (white crosses). Fig. 7 shows a strong positive correlation between  $\log b$  and  $\log \tilde{N}_{\rm HI}$  for both models. We fit this corre-

lation with a straight line of the form  $b=b_0 \ [\widetilde{N}_{\rm HI} \ / \ 10^{12.8}]^{\alpha}$  with  $b_0=(16.65,10.93)\ {\rm km\,s^{-1}})$  and  $\alpha=(0.32,0.41))$  for the hot and cold model, respectively. The hot model is in significantly better agreement with the observations than the cold model. The somewhat flatter slope in the hot model is likely due the flatter TDR in the hot simulation. Note further that the scatter in  $\log \widetilde{N}_{\rm HI}$  is slightly larger in the hot model. This is because the spikes are more blended and hence less distinctive (Fig. 1 and Fig. 4). The scatter in  $\log b$  is similar.

In summary, we find strong correlations of the Voigt

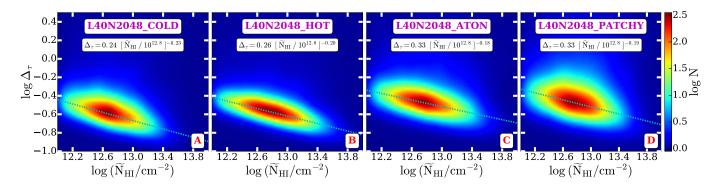


Figure 5. Panels A, B, C and D show the correlation of optical depth weighted overdensity ( $\Delta_{\tau}$ ) with the pseudo-column density ( $\log \tilde{N}_{\rm HI}$ ) of transmission spikes in, respectively, the *cold*, *hot*, *aton* and *patchy* models at 5.5 < z < 5.7. Irrespective of the model, the spikes correspond to underdensities i.e.,  $\Delta \sim 0.25$  for  $\log \tilde{N}_{\rm HI} = 12.8$  in the optically thin simulations and  $\Delta \sim 0.33$  for  $\log \tilde{N}_{\rm HI} = 12.8$  in the radiative transfer simulations. The correlation can be fitted with a straight line (cyan dotted line) and shows good agreement between the various models. The transmission spikes in the radiative transfer simulations are produced by regions with slightly larger densities ( $\Delta \sim 0.33$ ) than those in the optically thin simulations ( $\Delta \sim 0.25$ ). This is due to the spatial fluctuations in the photo-ionisation rate and temperature that are present in the radiative transfer simulations. We discuss the  $\Delta_{\tau}$  vs  $\log \tilde{N}_{\rm HI}$  correlation for the optically thin and radiative transfer simulations in §4.2.1 and §6.2.1, respectively.

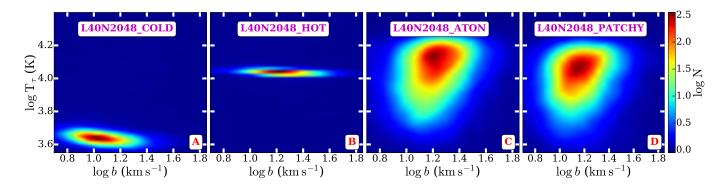


Figure 6. Panels A, B, C and D show the correlation of optical depth weighted temperature ( $T_{\tau}$ ) with the line-width parameter (log b) of spikes in, respectively, the cold, hot, aton and patchy models at 5.5 < z < 5.7. The b parameter and  $T_{\tau}$  are systematically larger in the hot model compared to the cold model. As shown in Fig. 3,  $T_{\tau}$  is larger in the aton model compared to the patchy model due to the presence of more gas at  $\Delta < 1$  and T < 30000 K in the aton model. The scatter in temperature in the RT simulation is much larger than that in optically thin simulations due to the presence of UV background and temperature fluctuations. We discuss the  $T_{\tau}$  vs (log b) correlation for optically thin and radiative transfer simulations in §4.2.2 and §6.2.2 respectively.

profile parameters with physical quantities in the optically thin simulations, where : (i) the gas probed by the transmission spikes is typically underdense ( $\Delta \sim 0.3$ ) and (ii) the spike widths (heights) are strongly (anti-) correlated with temperature (density).

#### 5 COMPARING TRANSMISSION SPIKE PROPERTIES IN OBSERVATIONS AND SIMULATIONS

### 5.1 Characterising the flux distribution in transmission spikes

Constraints on cosmological and astrophysical parameters from Ly $\alpha$  forest data have been obtained typically by using either a variety of statistical measures of the Ly $\alpha$  transmitted flux and/or Voigt profile decomposition (Storrie-Lombardi et al. 1996; Penton et al. 2000; McDonald et al. 2000, 2005; Viel et al. 2004b, 2009; Becker et al. 2011; Shull

et al. 2012). Here we briefly consider both approaches before focusing on constraints on the thermal state of the IGM from the width distribution of transmission spikes. The transmitted flux based statistics (such as the probability distribution function and power spectrum) are straightforward to derive from simulations and observations. For the Voigt profile parameter based statistics, we have fitted Voigt profiles to the inverted transmitted flux, 1 - F, using VIPER. The simulated spectra mimic the observed spectra in terms of S/N and instrumental resolution. VIPER accounts for these effects when determining the best fit parameters, the  $1\sigma$  statistical uncertainty on best fit parameters and a significance level for each Voigt component. For deriving the spike statistics, we chose only those Voigt components with relative error on parameters  $\leq 0.5$  and with a significance level  $\geq 3$ . We consider three statistics of the flux distribution in the transmission spikes that are sensitive to astrophysical parameters i.e.,  $\Gamma_{\rm HI}$ ,  $T_0$  and  $\gamma$  (for a given cosmology) which are discussed below.

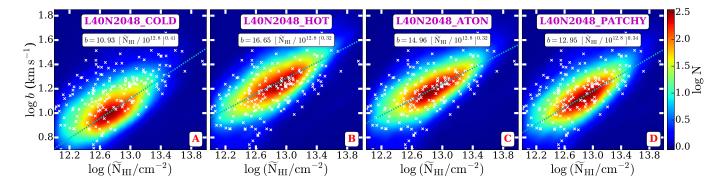


Figure 7. Panels A, B, C and D show the correlation of the line-width parameter (log b) with the pseudo-column density (log  $\tilde{N}_{HI}$ ) of the transmission spikes in, respectively, the cold, hot, aton and patchy models at 5.5 < z < 5.7. The correlation is fitted with a straight line (cyan dotted line). The log b parameter at fixed log  $\tilde{N}_{HI}$  is systematically larger in the hot model (b ~ 16.65 km s<sup>-1</sup> at log  $\tilde{N}_{HI}$  = 12.8) compared to the cold model (b ~ 10.93 km s<sup>-1</sup> at log  $\tilde{N}_{HI}$  = 12.8). The slope of the correlation is steeper for the cold (~ 0.41) model compared to the hot model ( $\sim 0.32$ ). The b parameters in the aton model (b ~ 14.96 km s<sup>-1</sup> at log  $\tilde{N}_{HI}$  = 12.8) are systematically larger than in the patchy model (b ~ 12.95 km s<sup>-1</sup> at log  $\tilde{N}_{HI}$  = 12.8). This is because temperatures in the aton model are larger than in the patchy models for  $\Delta < 1$  (see Fig. 6). The white crosses show the scatter in log b and log  $\tilde{N}_{HI}$  in the observed spectra. We discuss the (log b) vs log  $\tilde{N}_{HI}$  correlation for optically thin and radiative transfer simulations in §4.2.3 and §6.2.3 respectively.

### 5.2 Statistics of the flux distribution in transmission spikes

#### 5.2.1 Spike width (b-parameter) distribution function

For absorption features the line width distribution is frequently used as a diagnostic for the gas temperature, turbulence, and the impact of stellar and AGN feedback on the IGM at z < 5 (Tripp et al. 2008; Oppenheimer & Davé 2009; Muzahid et al. 2012; Viel et al. 2017; Gaikwad et al. 2017a; Nasir et al. 2017). By contrast, the width of the individual spikes is not a direct measure of the temperature of the low density gas (i.e.,  $b_{\rm spike} \neq \sqrt{2k_{\rm B}T/m}$ ). Nevertheless we find that the widths of transmission spike components is systematically larger if the temperature of the IGM is larger. <sup>4</sup>

### 5.2.2 Pseudo Column Density Distribution Function (pCDDF)

Similar to the H I column density distribution function (CDDF) at low redshift, we define the pseudo-CDDF (pCDDF) as the number of spikes with a pseudo column density in the range  $\log \widetilde{N}_{\rm HI}$  to  $\delta \log \widetilde{N}_{\rm HI}$  in the redshift interval z to  $z+\delta z$  (Schaye et al. 2000; Shull et al. 2012). We calculate the pCDDF in 7  $\log \widetilde{N}_{\rm HI}$  bins centered at 12.7, 13.1,  $\cdots$ , 13.9 with dlog  $\widetilde{N}_{\rm HI}=0.2$ . This choice of bins is motivated by the S/N and resolution of the observed spectra. The pCDDF characterizes the height and number of spikes in a given redshift bin, and is sensitive to the thermal and ionization parameters of the IGM.

#### 5.2.3 Transmitted flux power spectrum (FPS)

The transmitted flux power spectrum (FPS) is frequently used to constrain cosmological (McDonald et al. 2000; Meiksin & White 2004; Viel et al. 2004b) and astrophysical parameters (especially parameters describing the thermal state; Walther et al. 2019; Boera et al. 2019). The FPS is a measure of the clustering of the pixels in transmission spikes. One can also study the two point correlation of spikes (see e.g., Maitra et al. 2019). However, due to the limited number of observed QSOs and the smaller number of spikes detected per sightline, the two point correlation function of spikes is rather noisy. It is important to note that, unlike the pCDDF or the spike width distribution, the FPS is a transmitted flux based statistic that does not require us to fit the spikes. The FPS can, however, only be reliably estimated for a limited range of scales because of finite length of the spectra and other systematic effects. The smallest k (larger scales) modes are limited by the length of the simulation box and continuum fitting uncertainties of the observed spectra. The largest k modes (smallest scales) on the other hand are limited by the resolution of the instrument and the noise properties (S/N and noise correlation scale if non-Gaussian) of the observed spectra. To account for this, we calculate the FPS in the range  $0.01 \le k \, (\mathrm{s \, km}^{-1}) \le 0.237$  with bin width  $\delta \log k = 0.125$  (Kim et al. 2004).

### 5.3 Transmission spike statistics: optically thin simulations vs observations

Fig. 8 compares the spike width distribution, pCDDF and FPS from observations with that of the optically thin simulations (*hot* and *cold* model) for three different redshift bins centered at z = (5.4, 5.6, 5.8). All three spike statistics from

<sup>&</sup>lt;sup>4</sup> Since spikes trace cosmic voids, the spike width distribution could in principle also be sensitive to cosmological parameters e.g., h,  $\Omega_{\Lambda}$ ,  $\sigma_{8}$  and  $n_{s}$ . In this work we used the spike width distribution to constrain the thermal state of IGM for a given cosmology.

 $<sup>^5</sup>$  The mean transmitted flux in both models is matched to that in the observed spectra to account for the uncertainty in the continuum placement and UV background amplitude, see appendix A.

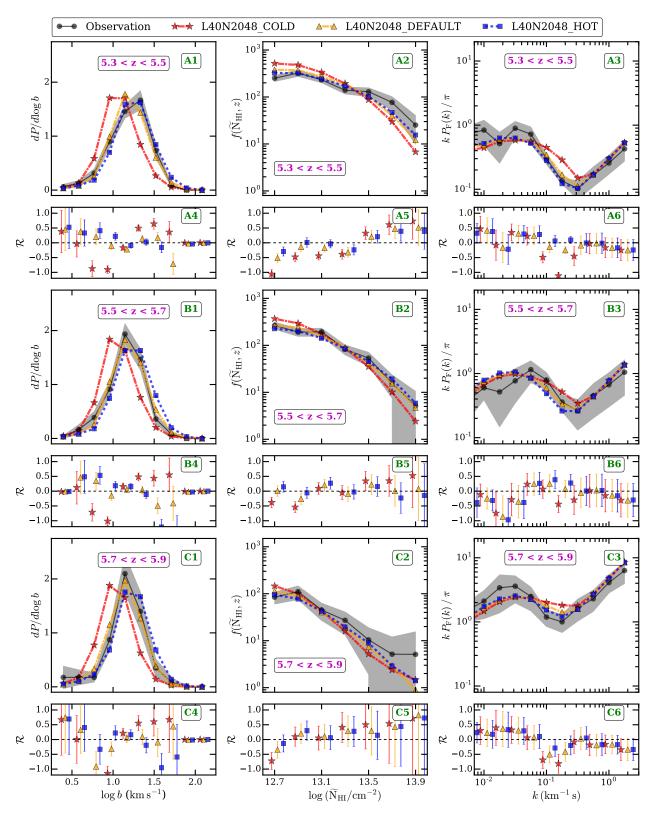


Figure 8. Panels A1, A2 and A3 show a comparison of spike width distribution, pCDDF and FPS from observations (black circles) with those from cold (red stars), default (orange triangles) and hot (blue squares) optically thin simulations at 5.3 < z < 5.5. The  $1\sigma$  uncertainties are estimated from the simulated spectra and are shown by the grey shaded regions. Panels A4, A5 and A6 show the corresponding residuals between the models and observations. The errors in panel A4-A6 corresponds to gray shaded region in panel A1-A3. For visual purposes, the residuals are slightly shifted along the x axis for the two models. Panels B1-B6 and C1-C6 are similar to panels A1-A6 except for the different redshift range, 5.5 < z < 5.7 and 5.7 < z < 5.9, respectively. Note that the hot and default models are in better agreement with observations than the cold model at all redshifts. The spike statistics in the default model are very close to those of the best fit model obtained by varying  $T_0$  and  $\gamma$  in §5.4.

the hot model are in better agreement with observations in the three redshift bins. The corresponding residuals show the level of agreement between the hot model and observations, which agree to within  $\sim 1.6\sigma.$  The cold model predict more power on small scales, a larger number of spikes with small  $\log \widetilde{N}_{\rm HI}$  and spikes with smaller widths that are not consistent with observations. The spike statistics from the hot model with  $T_0 \sim 11000~{\rm K}$  and  $\gamma \sim 1.2$  are consistent with observations for our optically thin simulation.

### 5.4 Constraining thermal parameters with optically thin simulations

In the optically thin simulations there is a well defined TDR in underdense and moderately overdense regions. It is thus common practice to study the effect of the thermal state on flux statistics by imposing different TDRs by rescaling temperatures (Hui & Gnedin 1997; Rorai et al. 2017b, 2018). In Appendix B we use such rescaling to show how the three flux statistics we consider here depend on thermal parameters  $T_0$ and  $\gamma$  and the photo-ionization rate, and demonstrate that it is the width distribution of the transmission spikes which is most sensitive to the thermal state of the gas. We further show that, for the reionisation and thermal history models we consider in this work, the spike statistics are only very weakly affected by pressure (Jeans) smoothing at the typical gas densities probed by the Ly $\alpha$  transmission spikes (Gnedin & Hui 1998; Theuns et al. 2000; Peeples et al. 2010; Kulkarni et al. 2015; Lukić et al. 2015; Nasir et al. 2016; Maitra et al. 2019; Wu et al. 2019).

We use the spike width distribution to obtain an estimate of the best fit values and uncertainty for the thermal parameters <sup>6</sup>. We vary  $T_0$  and  $\gamma$  by assuming a TDR of the form  $T = T_0 \Delta^{\gamma-1}$  for  $\Delta < 10$  and  $T = T_0 10^{\gamma-1}$  for  $\Delta \geq 10$ . We use the  $\Delta$  and v fields from the optically thin default model, which falls in between the cold and hot models. We vary  $T_0$  between  $6000\,\mathrm{K}$  to  $20000\,\mathrm{K}$  in steps of  $500\,\mathrm{K}$ and  $\gamma$  between 0.4 to 2.0 in steps of 0.05. For each model we (i) compute the Ly $\alpha$  transmitted flux, (ii) post-process the transmitted flux to match observations, (iii) fit the inverted transmitted flux with Voigt profiles and (iv) compute spike statistics. We use 2000 sightlines for each model. Fig. 9 shows the  $1\sigma$  constraints on  $T_0 - \gamma$  in three redshift bins. Fig. 9 also show the marginal distributions of  $T_0$  and  $\gamma$ . Table 3 summarizes the best fit values and uncertainty on  $T_0$  and  $\gamma$  values under the assumption that the IGM is optically thin. The uncertainty on  $T_0$  and  $\gamma$  measurement accounts for the uncertainty due to continuum fitting, mean flux and jeans smoothing effects (see Appendix A and B). The best fit values and uncertainty on  $T_0$  and  $\gamma$  are consistent within  $1\sigma$  for the 3 redshift bins.

Fig. 10 compares the evolution of  $T_0$  and  $\gamma$  from this work with a variety of measurements in the literature (Becker et al. 2011; Bolton et al. 2012, 2014; Boera et al.

**Table 3.** Constraints on  $T_0 - \gamma$  from optically thin simulations

Redshift	$T_0 \pm \delta T_0$	$\gamma \pm \delta \gamma$
5.3 < z < 5.5	$11000 \pm 1600$	$1.20 \pm 0.15$
5.5 < z < 5.7	$10500 \pm 2100$	$1.28 \pm 0.16$
5.7 < z < 5.9	$12000 \pm 2000$	$1.04 \pm 0.18$

2014; Rorai et al. 2017b; Hiss et al. 2018; Walther et al. 2019; Boera et al. 2019). <sup>8</sup> Theoretical models for the evolution of  $T_0$  and  $\gamma$  from Puchwein et al. (2019) and Haardt & Madau (2012) are shown by the dashed and dotted curves, respectively. The  $T_0$  and  $\gamma$  evolution in these models is obtained for a uniform but time evolving UVB and assuming non-equilibrium ionization evolution. Our  $T_0$  and  $\gamma$  constraints in the redshift range 5.3 < z < 5.9 are consistent with the corresponding evolution of the default model in Puchwein et al. (2019) within  $1\sigma$ .

Fig. 10 also shows that the  $T_0$  evolution in the hot (cold) model is systematically larger (smaller) than in the corresponding default model. The errors on  $T_0$  and  $\gamma$  account for the statistical and systematic uncertainty (mainly due to continuum fitting). It is interesting to note that the uncertainty on our  $T_0$  measurement is smaller than the  $T_0$ evolution spanned by the hot and cold models. Our  $T_0$  ( $\gamma$ ) measurements are higher (lower) than the measurement of Walther et al. (2019). Note, however, that the  $T_0$  and  $\gamma$ constraints in Walther et al. (2019) are obtained using the FPS whereas we obtained the  $T_0$  and  $\gamma$  constraints from the spike width distribution that is less sensitive to continuum placement and  $\Gamma_{\rm HI}$  uncertainty (see appendix A). Further note that the best fit  $T_0$  and  $\gamma$  values obtained for the three redshift bins are close to those in the default optically thin simulation.

Fig. 8 also shows that the FPS and pCDDF statistics of the default model are consistent with the observations within 1.5  $\sigma$ . The best fit model obtained by matching the spike width distribution with observations should therefore also have FPS and pCDDF statistics in good agreement with observations. Our  $\gamma$  constraints ( $\gamma \sim 1.2$ ) correspond to a TDR that is moderately flatter than isothermal. However, as we show later, there is no single power law TDR at the redshift of our analysis since the reionization is a patchy inhomogeneous process with different regions reionising at different times. At 5.3 < z < 5.9,  $\gamma$  is therefore not well defined in our RT simulations (Keating et al. 2018). In summary, the  $T_0$  ( $\gamma$ ) constraints obtained in this work are larger (smaller) than those obtained by (Walther et al. 2019). We do not see a significant evolution of  $T_0$  and  $\gamma$  in the redshift range 5.3 < z < 5.9.

Transmission spikes in optically thin simulations are mainly produced by fluctuations in the density field and the effect of peculiar velocities. Furthermore, the temperature is strongly and tightly correlated with density in optically thin simulations. However, at the redshifts considered here this almost is certainly not realistic. One would expect a large

 $<sup>^6</sup>$  We find that the FPS and pCDDF statistics are sensitive to continuum fitting uncertainty and  $\Gamma_{\rm HI},$  whereas the spike width distribution is less sensitive to continuum placement and  $\Gamma_{\rm HI}$  (see Appendix A)

<sup>&</sup>lt;sup>7</sup> To a good approximation, the likelihood function is Gaussian distributed on  $T_0 - \gamma$  grids. See Appendix C for details.

<sup>&</sup>lt;sup>8</sup> Bolton et al. (2012) measure  $T_0$  in QSO proximity regions at  $z \sim 6$ . Their  $T_0$  constraint including (excluding) a model for the He II photo-heating by the QSOs is shown by green circles (blue squares) in Fig. 10.

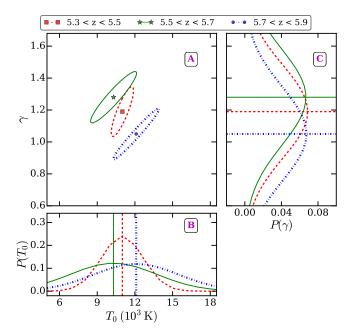


Figure 9. Panel A shows  $1\sigma$  constraints on  $T_0$  and  $\gamma$  obtained by comparing the transmission spike width distribution from optically thin simulations with observations at 5.3 < z < 5.5 (red dashed curve), 5.5 < z < 5.7 (green solid curve) and 5.7 < z < 5.9 (blue dotted curve).  $T_0$  and  $\gamma$  are varied in post-processing assuming a power-law TDR (the effect of Jeans smoothing is small, see Fig. B5 in the appendix). Panel B and C shows the marginal distributions for  $T_0$  and  $\gamma$  respectively. The best fit  $T_0$  and  $\gamma$  for 5.3 < z < 5.5 are shown by the red square in panel A and red dashed lines in panel B and C, respectively. Corresponding best fit values for 5.5 < z < 5.7 and 5.7 < z < 5.9 are shown by the green star and solid line and blue circle and dotted line, respectively.

scatter in temperature for a given density as the reionization process will be inhomogeneous, with different regions ionized at different times (Abel & Haehnelt 1999; Miralda-Escudé et al. 2000; Trac et al. 2008; Choudhury et al. 2009). The resulting spatial fluctuations in the amplitude of the UVB and the TDR are not present in optically thin simulations<sup>9</sup>. However, as shown in §2.3, transmission spikes can also be produced by fluctuations in the UVB amplitude and/or temperature. Including these radiative transfer (RT) effects is therefore particularly relevant if reionization ends as late as suggested by the large spatial fluctuations in the Ly $\alpha$  forest opacity (Keating et al. 2019; Kulkarni et al. 2019b).

### 6 FULL RADIATIVE TRANSFER SIMULATIONS

## 6.1 The radiative transfer simulations in the Sherwood-relics simulation suite

In addition to the optically thin simulations discussed in §3.1, we have also performed post-processed radia-

tive transfer simulations and hybrid radiative transfer/hydrodynamical simulations as part of the Sherwood-relics simulation suite. The former simulations model patchy reionization by performing the radiative transfer in post processing on optically thin simulations. This captures many aspects of patchy reionization such as large spatial fluctuations in the photoionization rate and temperature, but misses the hydrodynamic response of the IGM to the heating and can thus not accurately predict spatial variations in the pressure smoothing or the distribution of shock heated gas. The hybrid simulations aim to capture these aspects as well.

The post-processed radiative transfer simulations were performed with the GPU-accelerated ATON code Aubert & Teyssier (2008), which uses a moment based radiative transfer scheme along with the M1 closure relation. The advection of the radiation was performed using the full speed of light and a single frequency bin for all ionizing photons. Ionizing sources were inserted into dark matter halos as in Kulkarni et al. (2019b). The (mean) energy of ionizing photons was assumed to be 18.6 eV. In the following, we will refer to the post-processed radiative transfer simulation performed on top of our default optically thin simulation by the term aton simulation. It used 2048³ cells in the  $(40 \, h^{-1} \, {\rm Mpc})^3$  box and hydrogen reionization completes at  $z \approx 5.2$ , consistent with the late reionization history found to be favoured by large scale Ly $\alpha$  forest fluctuations (Kulkarni et al. 2019b).

The hybrid radiative transfer/hydrodynamical simulation, referred to as the patchy simulation, takes the reionization redshift and HI photoionization rate maps produced in the aton simulation as inputs. These are fed to our modified version of P-GADGET-3, where they are used in the nonequilibrium thermochemistry solver instead of an external homogeneous UV background model. To obtain consistent density and radiation fields, we use the same initial conditions as in the default optically thin simulation on which the aton run is based. At each timestep, for each SPH particle we check whether it resides in a region in which reionization has already begun. This is assumed to be the case if the ionized fraction in the corresponding cell of the aton simulation has exceeded 3 percent. All particles located in such regions are assumed to be exposed to an ionizing radiation field, which is obtained by interpolating the  $\Gamma_{\rm HI}$  maps produced by aton in redshift and reading out the value of the cell containing the particle. This value is then adopted for  $\Gamma_{\rm HI}$  in the nonequilibrium thermochemistry solver. The HI photoheating rate is computed from  $\Gamma_{\rm HI}$  assuming the same mean ionizing photon energy, 18.6 eV, as in aton. As we do not follow HeI and He II ionizing radiation separately, we use a few simple assumptions to set their photoionization and heating rates. For He I we use the same photoionization rate as for HI, but we adopt a photoheating rate that is 30 percent larger than that of Hi. For Heii, we use the rates of the fiducial UV background model of Puchwein et al. (2019). This hybrid method results in ionized regions and inhomogeneous photoheating that closely match those in the parent radiative transfer run, while at the same time following the hydrodynamics and hence including consistent pressure smoothing, as well as shock heating.

<sup>&</sup>lt;sup>9</sup> For optically thin simulations, the variation in temperature along a sightline is due to the variation in the density field.

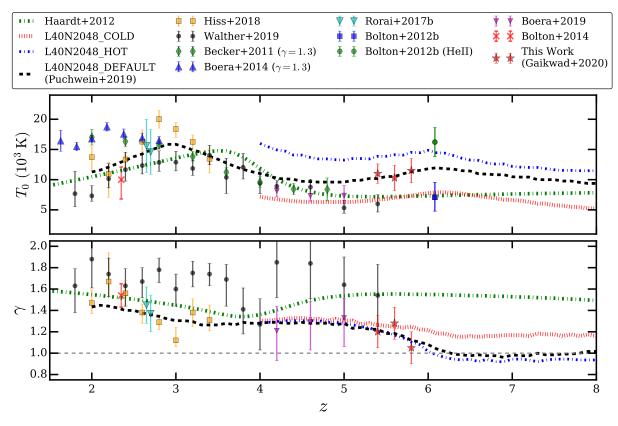


Figure 10. The evolution of thermal parameters  $T_0$  and  $\gamma$  from the literature and in this work (red stars with error bars) are shown in the top and bottom panels, respectively (Becker et al. 2011; Bolton et al. 2012, 2014; Boera et al. 2014; Rorai et al. 2017b; Hiss et al. 2018; Walther et al. 2019; Boera et al. 2019). Note that the temperature constraints from Becker et al. (2011) and Boera et al. (2014) are not measured at the mean density, and have therefore been scaled to a  $T_0$  value assuming a TDR with slope  $\gamma = 1.3$ . The  $T_0$  and  $\gamma$  evolution in the hot, default and cold Sherwood-relics simulations is shown by the blue dash-dotted, black dashed and red dotted curves respectively. The corresponding  $T_0$  and  $\gamma$  evolution in the Haardt & Madau (2012) UVB synthesis model is shown by green dotted curve. This  $T_0$  and  $\gamma$  evolution is obtained by assuming a uniform UVB and solving for the non-equilibrium ionization evolution (Haardt & Madau 2012; Puchwein et al. 2019). Our constraints on  $T_0$  and  $\gamma$  are consistent within  $1\sigma$  with Puchwein et al. (2019).

### 6.2 The thermal state of the gas in full radiative transfer simulations

The main difference in the radiative transfer simulation is that there are large spatial variations in the TDR (Trac et al. 2008; Keating et al. 2018; Kulkarni et al. 2019b). In panels C and D of Fig. 3 we can compare the TDRs from the aton and patchy RT simulations to the optically thin simulations in panels A and B. Unlike the optically thin simulations, the TDR in the radiative transfer simulations at  $\Delta < 10$  can not be described by a single power law (Bolton et al. 2004). The regions that have been ionized most recently have a flat TDR while regions that have been ionised earlier have progressively steeper TDRs. In the redshift range considered here there are also still significant spatial fluctuations in the amplitude of the UVB. As a result, the variations in temperature for a given  $\Delta < 10$  is large. A crucial difference between the aton and patchy simulations is also evident in Fig. 3. The aton simulation does not account self-consistently for shock heating of the gas. There is thus much less gas with T > 30000 K in the aton simulation than in the patchy simulation. As a consequence there is less gas with  $\Delta < 10$  in the temperature range described by two straight lines (see Fig. 3) in the patchy simulation. As we will show later this has the effect of producing slightly larger spike widths in the aton simulations.

Table 2 also shows the physical effects responsible for the occurrence of spikes in the aton and patchy radiative transfer simulations. Similar to the optically thin simulations, most of the spikes ( $\sim 89$  percent) in the aton and patchy simulations occur in underdense regions and for  $\sim 18$  percent of spikes the gas shows a diverging velocity field along the sightline. However, in contrast to optically thin simulations, around 50 percent of spikes show an enhancement of  $\Gamma_{\rm HI}$  and temperature. Thus, for the transmission spikes in the full radiative transfer simulations, all the physical processes discussed in §2.3 and Fig. 2 contribute to the occurrence of spikes.

### 6.2.1 Dependence of spike height on density: $\Delta_{\tau}$ vs $\log \widetilde{N}_{trr}$

In Fig. 5 we compare the dependence of  $\Delta_{\tau}$  on  $\log \widetilde{N}_{\rm HI}$  for the *aton* and *patchy* simulations to the optically thin *cold* and *hot* simulations. Similar to the optically thin simulations (Fig. 5),  $\Delta_{\tau}$  and  $\log \widetilde{N}_{\rm HI}$  are anti-correlated. The normalization ( $\Delta_0$ ) and slope ( $\beta$ ) are similar in both simulations. The  $\Delta_0$  ( $\beta$ ) in the RT simulations are slightly larger

(smaller) compared to the optically thin simulations. The spikes (irrespective of  $\log \widetilde{N}_{\rm HI}$ ) in the RT simulations are produced from underdensities somewhat larger than in the optically thin simulations. This is expected, as spikes (at a given  $\log \widetilde{N}_{\rm HI}$ ) in the RT simulations are produced by all four physical effects we discussed previously, i.e., fluctuations in density, peculiar velocity, UVB and temperature. Fig. 5 also shows that the scatter in  $\Delta_{\tau}$  (at a given  $\log \widetilde{N}_{\rm HI}$ ) is larger in the radiative transfer simulations due to fluctuations in UVB, temperature and pressure smoothing effects. Note, however, that in all simulations the spikes occur in underdense regions with  $\Delta < 1$ .

#### 6.2.2 Dependence of temperature on spike width: $T_{\tau}$ vs b

Fig. 6 compares the dependence of optical depth weighted temperature ( $T_{\tau}$ ) on spike widths (b-parameter) for the RT simulations with that in the optically thin simulations. Unlike the optically thin simulations, the RT simulations show a large scatter in temperature for a given spike width due to fluctuations in the UVB amplitude and temperature. Furthermore, the temperature in the patchy simulation is smaller than in the corresponding aton simulation. This is because (i) the amount of gas with  $\Delta < 1$  and  $T < 30000\,\mathrm{K}$  is larger in the patchy simulation and (ii) due to the post-processed nature of the aton simulation the (adiabatic) change in the temperature due to changes in density (the  $d\Delta/dt$  term) is not accounted. As a result, the spike widths are also slightly smaller in the patchy simulations.

#### 6.2.3 The relation of spike width and height: b vs $\log \widetilde{N}_{HI}$

Fig. 7 compares the  $b-\log \widetilde{N}_{\rm HI}$  correlation for the aton and patchy simulations to that in the optically thin simulations. Similar to the optically thin simulations,  $\log b$  and  $\log N_{\rm HI}$ are strongly anti-correlated in the RT simulations. The normalization of the correlation  $b_0$  is smaller in the patchy  $(\sim 12.95 \text{ km s}^{-1})$  simulation than in the aton  $(\sim 14.96)$ km s<sup>-1</sup>) simulation due to the smaller temperature of the gas probed by the transmission spikes in the latter. The slope of the correlation ( $\alpha = 0.32$  for aton and  $\alpha = 0.34$  for patchy) and the scatter in the TDR (at  $\Delta < 1$  in Fig. 3) is relatively similar for both simulations. It is interesting to note here that  $\alpha$  in the RT simulations is similar to that in the hot optically thin simulation, while  $b_0$  in the RT simulations is smaller than in the *hot* optically thin simulations. The smaller value of  $b_0$  in the RT simulation is a consequence of fluctuations in UVB amplitude and temperature.

In summary, the RT simulations include the effects of fluctuations in the UVB amplitude and temperature which are missing in the optically thin simulations. Due to these effects: (i) the TDR in RT simulations cannot be described by a single power-law, (ii) the typical densities responsible for transmission spikes in the RT simulations ( $\Delta_0 \sim 0.33$ ) is slightly larger than in optically thin simulations ( $\Delta_0 \sim 0.25$ ) and (iii) the scatter in temperature and spike width are larger.

### 6.3 Transmission spike properties: Full radiative transfer simulations vs observations

We now compare the three spike statistics from the RT simulations with observations in Fig. 11. Each panel is similar to Fig. 8, except we now use the aton and patchy simulations. Comparison of Fig. 11 with Fig. 8 shows that the RT simulations are in even better agreement with the observations than the optically thin simulations at all redshifts. The three spike statistics are furthermore very similar in the aton and patchy simulations at all redshifts. The spike widths in the aton simulations are somewhat larger than in the patchy simulation and in marginally better agreement with observations than in the patchy simulations. As explained in the previous section, this is due to the effect of slightly higher gas temperatures in the aton simulations. Note, however, that both RT simulations are mono-frequency and the normalisation of the temperature distribution predicted by the RT simulations is still somewhat uncertain.

Fig. 12 shows the comparison of the  $T_0$  and  $\gamma$  evolution with that from  $T_0 - \gamma$  measured assuming a uniform UVB. Since there is no single power-law TDR in the RT simulations (see Fig. 3), we show a range in  $T_0$  and  $\gamma$  evolution. To obtain this range in  $T_0$  and  $\gamma$ , we find the 16<sup>th</sup> and 84<sup>th</sup> percentile temperature in four  $\Delta$  bins. We then fit a power-law TDR to the 16<sup>th</sup> and 84<sup>th</sup> percentile temperature values (see Fig. 3<sup>10</sup>). Fig. 12 shows that the  $T_0 - \gamma$  constraints obtained here are consistent with the range in the  $T_0 - \gamma$  evolution seen in the patchy and aton RT simulations.

Thus, quite remarkably the patchy simulation based on the self-consistent reionization model of Kulkarni et al. (2019b) that (i) simulates cosmological density and velocity fields, (ii) includes spatial fluctuations in the UV background and TDR, (iii) accounts for the pressure smoothing of gas and (iv) matches with observations of  $\tau_{\rm eff,HI}$  (Bosman et al. 2018) and Thomson scattering optical depth (Planck Collaboration et al. 2018), also produces transmission spike properties consistent with those in observed high-resolution, high-z QSO absorption spectra. Note, however, that there is still some uncertainty in the post-reionization temperatures in RT simulations (see D'Aloisio et al. 2019, Puchwein et.al., in prep). For example, the temperatures in Keating et al. (2019) are somewhat lower than those in (Kulkarni et al. 2019b).

#### 7 CONCLUSIONS

Transmission spikes observed in high-z QSO absorption spectra are a useful tool to probe the physical state of the IGM near the tail end of H I reionization. We constrain the thermal state of the IGM at 5.3 < z < 5.9 by comparing the properties of Ly $\alpha$  transmission spikes from a sample of 5 high resolution ( $v_{\rm FWHM} \sim 6~{\rm km\,s^{-1}}$ ) and high S/N ( $\sim 10$ ) QSO absorption spectra with that from state-of-the-art, high resolution optically thin simulations run with GADGET-3 (Springel 2005) from the Sherwood and Sherwood-relics

 $<sup>^{10}</sup>$  The  $T_0$  and  $\gamma$  for aton and patchy models in Fig. 3 are calculated using  $5^{\rm th}$  and  $95^{\rm th}$  percentile.

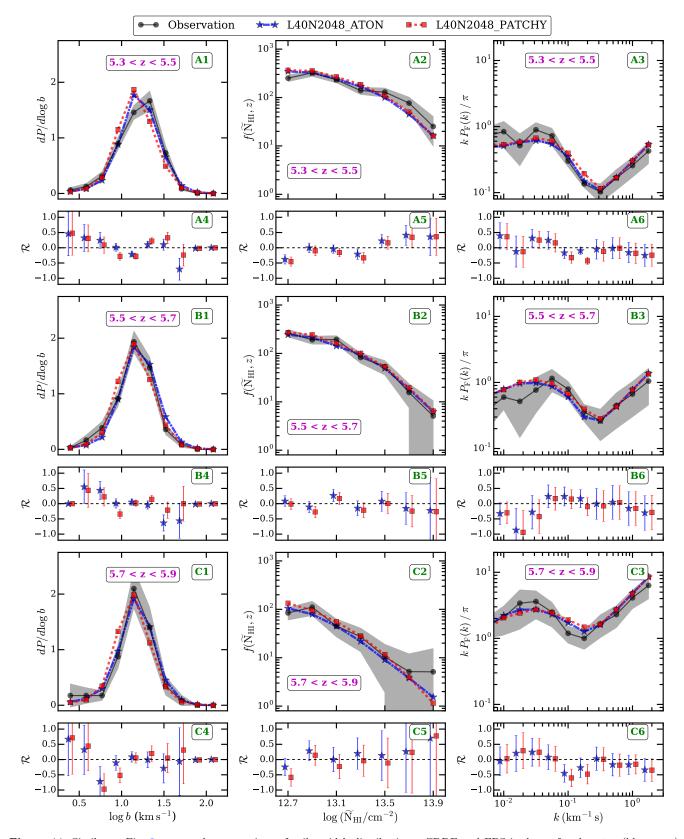


Figure 11. Similar to Fig. 8, except the comparison of spike width distribution, pCDDF and FPS is shown for the *aton* (blue stars) and *patchy* (red stars) RT simulations. The statistics from the RT simulations are in better agreement with observations compared to those from the optically thin simulations (Fig. 8) at all redshifts (see §6.3).

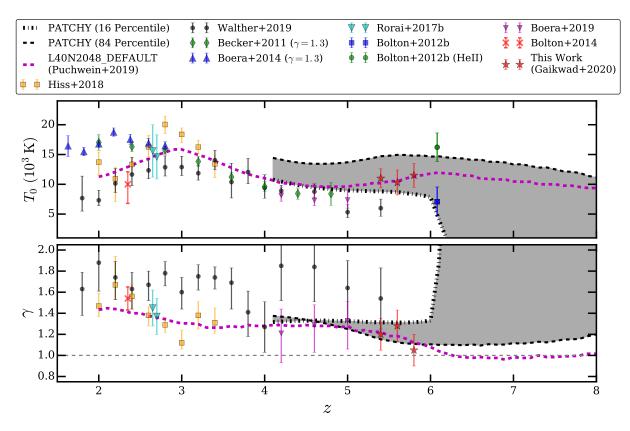


Figure 12. Same as Fig. 10, except the  $T_0$  and  $\gamma$  evolution is shown from the patchy RT simulation (shaded region). Since there is no single power-law TDR in the RT simulations (see Fig. 3), the shaded region displays the  $16^{\rm th}$  and  $84^{\rm th}$  percentiles of  $T_0$  and  $\gamma$  (see §6.3). For comparison, we also show the  $T_0$  and  $\gamma$  evolution (magenta dashed line) from the uniform UVB default model.

suites, as well as a simulation post-processed with the radiative transfer code *aton* (Aubert & Teyssier 2008). The main results of this work are as follows.

- In full radiative simulations regions with low density, enhancement in the photo-ionization rate  $\Gamma_{HI}$ , enhancement in temperature and a diverging peculiar velocity field along the line of sight can all contribute to the occurrence of transmission spikes at high redshift. Most of the spikes ( $\sim 90$  per cent) in optically thin and radiative transfer simulations occur in regions with density  $\Delta < 1$ . Optically thin simulations do not account for the effect of enhanced temperatures in recently ionised regions and the resulting spatial fluctuations in the temperature-density relation. Due to the assumed spatially homogeneous UV background amplitude they also do not account for the occurrence of transmission spikes due to enhancements in the photo-ionization rate. About 50 per cent of the transmission spikes in our RT simulations show the effect of an enhanced  $\Gamma_{\rm HI}$  and enhanced temperature. In the RT simulation the transmission spikes are often due to either hot, recently ionized, very underdense regions with a diverging line of sight peculiar velocity field or due to somewhat less underdense and colder regions with an enhanced photo-ionization rate.
- The width of the asymmetric and blended transmission spikes are very sensitive to the instantaneous temperature of the gas and are significantly broader in the optically thin *hot* simulation than in the corresponding *cold* simulation. To quantify this, we have fitted multi-component

Voigt profiles to the inverted transmitted flux 1-F in both simulated and observed spectra with our automated code VIPER (Gaikwad et al. 2017b). We derive the transmitted flux power spectrum, pseudo column density distribution function (pCDDF) and spike width (b-parameter) distribution functions for simulated and observed spectra. We show that the spike width distribution is the statistic that is most sensitive to the thermal state of the IGM. The dependence of the shape of the FPS and pCDDF on the temperature of the absorbing gas is somewhat weaker while their normalization is more sensitive to the ionization state/neutral fraction of the IGM.

- We associate the observable properties of spikes with the physical properties of gas in simulations by studying the  $\Delta_{\tau}-\log \tilde{\rm N}_{\rm HI},~T_{\tau}-b$  and  $b-\log \tilde{\rm N}_{\rm HI}$  correlations. These correlations show that the underdensity of gas associated with spikes is similar i.e.,  $\Delta_{\tau}\sim 0.3$  at  $\log \tilde{\rm N}_{\rm HI}\sim 12.8$  in both optically thin and radiative transfer simulations. The spike widths in both simulations are sensitive to the temperature of the gas ( $b\sim 10.9~{\rm km\,s^{-1}}$  for  $T_0\sim 7500~{\rm K}$  and  $b\sim 16.6~{\rm km\,s^{-1}}$  for  $T_0\sim 14000~{\rm K}$ ). However, the temperature scatter for a given density is larger in the radiative transfer simulation compared to the optically thin simulation. As a result, a significant fraction of spikes in the radiative transfer simulations are due to hotter temperatures in recently ionized regions of the Universe.
- We have compared the three observed spike statistics with those derived from our optically thin *hot* and *cold* simulations in three redshift bins. The spike statistics from the

hot model ( $T_0 \sim 14000$  K and  $\gamma \sim 1$  at z=5.8) are consistent within  $1.6\sigma$  with those from observations in all the 3 redshift bins. The cold model differs by more than  $3\sigma$  from the observations. We constrain thermal parameters by varying  $T_0$  and  $\gamma$  in post-processed optically thin simulations. The best fit values at  $5.3 \leq z \leq 5.5$ ,  $5.5 \leq z \leq 5.7$ , 5.7 < z < 5.9 are  $T_0 \sim 11000 \pm 1600$ ,  $10500 \pm 2100$ ,  $12000 \pm 2000$  K and  $\gamma \sim 1.20 \pm 0.15$ ,  $1.28 \pm 0.16$ ,  $1.05 \pm 0.18$  respectively. We do not find significant evolution in  $T_0$  and  $\gamma$  over 5.3 < z < 5.9.

• We have also compared the three spike statistics in physically motivated radiative transfer simulations with those from observations. Unlike optically thin simulations, radiative transfer simulations incorporate spatial fluctuations in the amplitude of the UVB and the TDR. As a result the scatter in the TDR is large and a single power-law cannot describe the TDR in radiative transfer simulations. The observed spike statistics in our radiative transfer simulation of late reionization with neutral islands persisting to  $z\sim5.3$  are in good  $(1.2\sigma)$  agreement with observations in all three redshift bins.

Our work shows the potential of transmission spike shapes (heights and widths) for constraining the neutral fraction and temperature of the IGM near the tail-end of H I reionization, complimentary to other transmitted flux based methods. In future, a much larger sample of high resolution, high S/N and high-z QSO absorption spectra should become available thanks to 30–40 m class optical telescopes. These larger data sets, complemented by further improved radiative transfer simulations, promise to put tight constraints on the nature and the exact timing of H I reionization.

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### APPENDIX A: OBSERVATIONAL SYSTEMATICS

Fig. A1 shows Ly $\alpha$  forest covered by 5 QSO sightlines from our observed sample. The observed spectra are subject to systematics due to finite resolution, S/N and continuum fitting uncertainties. In this section, we quantify the effect of such systematics on spike statistics and illustrate the method we use to account for these effects.

#### A1 Continuum fitting uncertainty

Due to the large opacities towards high redshift QSOs, the continuum placement is non-trivial. We explained the method of our continuum fitting in §2. The uncertainty in the continum placement could be as high as 20 percent. We illustrate the effect of continuum fitting uncertainty on the shape of transmission spikes in Fig. A2. A large continuum placement uncertainty (shown by red shaded region in panel A and C), leads us to expect significant variation in the height of the spikes (panel D). However, the width of the spikes are relatively robust. To quantify the effect of the continuum, we calculate the three spike statistics (i.e. the FPS, pCDDF and spike width distribution) in Fig. A3 by using a low continuum  $(F_{\text{cont}} - \delta F_{\text{cont}})$ , a best fit continuum  $(F_{\text{cont}})$  and a high continuum  $(F_{\text{cont}} + \delta F_{\text{cont}})$ . The normalization of the FPS and pCDDF is sensitive to the continuum placement. The continuum placement does not have a strong effect on the peak of the spike width distribution, although the distribution is somewhat broader for a low continuum.

To reduce the effect of the continuum fitting uncertainty, we rescale the optical depth in the simulation to match the observed mean flux. We illustrate the effect of such rescaling on the observed spike statistics in Fig. A3. We rescale the observed spectra with a low and high continuum to match the observed mean transmitted flux corresponding to the best fit continuum. The corresponding "corrected" low and high continuum spike statistics (dotted line) are in very good agreement with the spike statistics corresponding to the best fit continuum. This demonstrates that the effect of continuum fitting on spike statistics can indeed be minimized by rescaling the simulated optical depth to match the mean observed flux.

#### A2 Effect of S/N

In this section we illustrate the effect of finite S/N on the detectability of spikes. Since high-z QSOs are usually faint and most of the observed pixels are close to  $F \sim 0$ , the noise in observed spectra is mostly determined by the sky background. Furthermore, the noise can vary along the wavelength axis. To minimize the effect of finite S/N on spike statistics, we degrade the simulated spectra with noise generated from the observed S/N per pixel array. The statistics computed from observed and simulated transmitted flux are consistent with each other. However, the ability of the Voigt fitting procedure crucially depends on the S/N of the spectra. To account for this, we compute a significance level (SL) for each Voigt component that accounts for the S/N, pixel seperation and resolution of the instrument (Gaikwad et al. 2017b). We select the Voigt components with SL > 3.

The finite S/N of the observed spectra also sets the completeness limit of the sample. That is, if  $\log \widetilde{N}_{\rm HI}$  is above the completeness limit, the lines would be detected with 100 per cent probability in the observed sample. However, one needs to account for the incompleteness of the sample for the lines with  $\log \widetilde{N}_{\rm HI}$  below the completeness limit. We account for the incompleteness of the sample by calculating the sensitivity curve as shown in Fig. A4. The plot shows the sensitivity curve for three redshift bins. The observed sample is 50 per cent complete for  $\log \widetilde{N}_{\rm HI} \sim 12.5$ . We use the area under the curve to calculate the pCDDF and thus account for the effect of finite S/N.

# APPENDIX B: SENSITIVITY OF SPIKE STATISTICS TO ASTROPHYSICAL PARAMETERS

Fig. B1 to Fig. B5 shows the sensitivity of our chosen statistics to the normalization of the TDR  $(T_0)$ , the slope of TDR  $(\gamma)$ , the HI photo-ionization rate  $(\Gamma_{\rm HI})$  and Jeans smoothing, respectively. We vary  $T_0$ ,  $\gamma$  and  $\Gamma_{\rm HI}$  in the post-processing step by using a power-law TDR  $T=T_0\Delta^{\gamma-1}$  and rescaling the optical depth under the assumption of photo-ionization equilibrium. This approach allows us to study the variation of spike statistics for a given parameter while keeping other parameters fixed.

Fig. B1 shows that all three transmission spike statistics are sensitive to  $T_0$ . The spike width distribution (left panel in Fig. B1) is most sensitive to  $T_0$  i.e., the spike width distribution is systematically shifted to larger b values for hotter models. The shape of the pCDDF (middle panel in Fig. B1) is also sensitive to  $T_0$ . This can be understood by examining Fig. 4, where we see that spikes in hotter models are usually more blended than cold models due to line of sight temperature and density smoothing effects. Due to such blending, VIPER fits fewer components with low  $\log \widetilde{N}_{\rm HI}$  and more components with high  $\log \widetilde{N}_{\rm HI}$  in hotter models. The FPS (right panel) is systematically lower at  $0.1 < k \, ({\rm km}^{-1} \, {\rm s}) < 1$  for  $T_0 = 25000$  K compared to  $T_0 = 10000$  K. This is expected as the increase in temperature smoothes the transmitted Ly $\alpha$  flux, reducing the small scale power.

We illustrate the sensitivity of the three statistics to  $\gamma$ in Fig. B2. It is not possible to vary the slope of the TDR around the mean density without then varying the temperature at the density where the spikes are most sensitive. For example, the spikes in the optically thin simulations are most sensitive to  $\Delta \sim 0.3$  (See Fig. 5). If we vary  $\gamma$ with the normalization of the TDR pivoted at  $\Delta = 1$ , (i.e. the  $T_0$  value), we obtain a large variation in temperature at  $\Delta = 0.3$ . As a result it is hard to disentagle the effect of variation in  $T_0$  from  $\gamma$ . To circumvent this problem, we pivot the TDR at the densities where spikes are most sensitive i.e.,  $\Delta = 0.3$ . Thus we use a power-law TDR of the form  $T = T_{0.3} [\Delta/0.3]^{\gamma-1}$ . The left and right panels in Fig. B2 show that the spike width distribution and FPS are less sensitive to the variation in  $\gamma$ . We see a slight variation in the shape of the pCDDF for a variation in  $\gamma$ , such that high  $\log N_{\rm HI}$  systems are less frequent for  $\gamma = 1.6$  than for  $\gamma = 1$ . This is a direct consequence of the lower temperature at  $\Delta < 0.3$ , since the spikes are more sensitive to  $\Delta < 0.3$  than  $\Delta > 0.3$ .

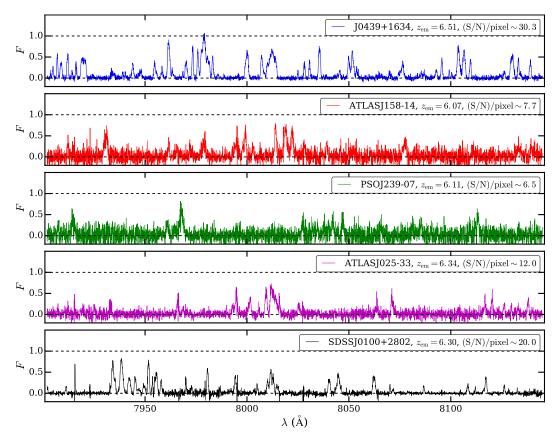


Figure A1. Examples of observed transmission spikes from the sample of 5 QSO sightlines.

The effect of the photo-ionisation rate  $\Gamma_{HI}$  is illustrated in Fig. B3. The heights and number of spikes (for a given S/N) are sensitive to  $\Gamma_{HI}$ . As a result, the normalization of the pCDDF is mostly sensitive to  $\Gamma_{HI}$  while the shape remains relatively unchanged. The normalization of the FPS depends on the mean transmitted flux, and since the mean transmitted flux varies with  $\Gamma_{HI}$  the normalization of the FPS is also different. However, the spike width distribution is relatively robust to large variations in  $\Gamma_{HI}$ , allowing one to minimize the degeneracy between  $\Gamma_{HI}$  and thermal parameters. Note the effect of continuum placement uncertainty is very similar to the variation in  $\Gamma_{HI}$  (see §A).

We show the recovery of  $T_0$  and  $\gamma$  for fiducial hot and cold model in Fig. B4. We vary TDR using  $\Delta$  field from default model for a range of  $T_0$  and  $\gamma$ . We use BPDF statistics to recover the  $T_0$  and  $\gamma$  from hot and cold model. Fig. B4 demonstrate that we can recover  $T_0$  and  $\gamma$  within  $1\sigma$  for wide range of  $T_0$  and  $\gamma$ .

We study the effect of pressure (or Jeans) smoothing in Fig. B5. We take the density and velocity fields from the default, hot and cold optically thin models and rescale the instantaneous temperatures and neutral hydrogen fractions to have the same values. Differences in the spike statistics due to pressure smoothing are therefore isolated from the effect of thermal broadening. In all three models reionisation completes at  $z\simeq 6.2$ , following the UVB synthesis model of Puchwein et al. (2019), with a total energy per proton mass of  $u_0=6.4\,\mathrm{eV}\,\mathrm{m_p}$  (default),  $u_0=12.4\,\mathrm{eV}\,\mathrm{m_p}$  (hot) and  $u_0=3.4\,\mathrm{eV}\,\mathrm{m_p}$  (cold) deposited over the redshift interval 6< z< 13 (cf. Nasir et al. 2016). For comparison,

Boera et al. (2019) have recently inferred  $u_0 = 4.6^{+1.4}_{-1.2} \text{ eV m}_p$ over the redshift interval 6 < z < 13 from new measurements of the Ly $\alpha$  FPS at z=5, which is consistent with our default simulation at  $\sim 1.3\sigma$ . Interestingly, Fig. B5 shows that the spike width distribution is only modestly sensitive to the pressure smoothing, despite the different integrated thermal histories in the models. This is in part because, relative to the IGM at  $z \leq 5$ , gas has had slightly less time to dynamically respond to changes in the pressure following the completion of reionisation at z = 6.2, and in part because the transmission spikes become rapidly more sensitive to the most highly underdense gas as redshift increases (where the dynamical time scales as  $t_{\rm dyn} = \sqrt{\pi/G\rho} \simeq H(z)^{-1}\Delta^{-1/2}$ ). We estimate that systematic uncertainties in the Jeans smoothing will therefore impact on the recovery of  $T_0$  by at most  $\delta T_0$  600 K (see Fig. B6). We add this uncertainty in quadrature to the final measurements we present for  $T_0$ . We have furthermore verified if we take a more extreme model where the IGM is ionised rapidly around z = 15, (i.e. the fiducial model in the original Sherwood simulation suite), larger differences in the spike width distribution due to Jeans smoothing are present. We argue here, however, that such an early end to reionisation is unlikely.

#### APPENDIX C: NUMERICAL EFFECTS

We assess the effect of simulation box size and mass resolution on convergence of the spike statistics in Fig. C1 and

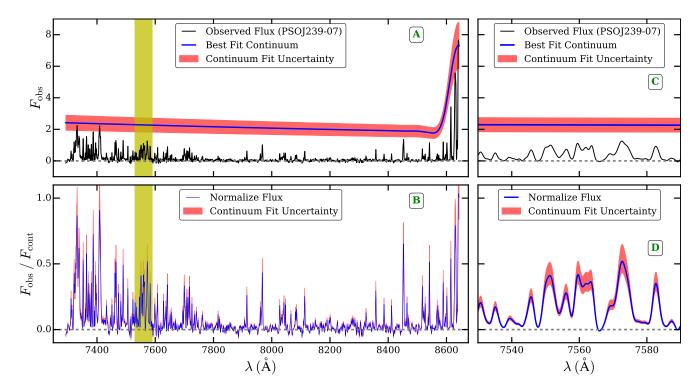


Figure A2. Panel A shows the observed flux  $(F_{\text{obs}})$  towards QSO PSOJ239-07 (black curve). The blue line and red shaded region show the best fit continuum  $(F_{\text{cont}})$  and the associated  $1\sigma$  uncertainty, respectively. Panel B shows the normalized flux (blue line) obtained by  $F_{\text{norm}} = F_{\text{obs}}/F_{\text{cont}}$ . For better visual appearance of this figure, the flux is smoothed using a Gaussian filter to reduce noise (we have not applied this Gaussian filter anywhere else). Panels C and D are the same as panels A and B, respectively, except that they show a zoomed version of the yellow shaded region in panels A and B. We use these high and low continuum fits to estimate the effect of continuum fitting uncertainty on transmission spike statistics.

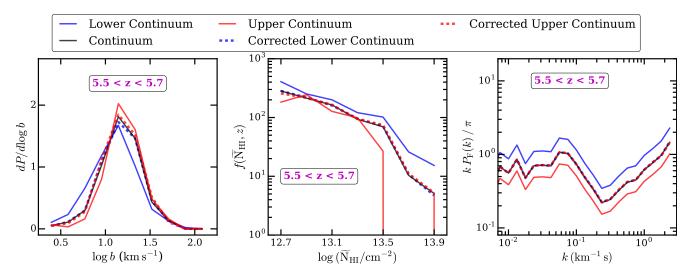


Figure A3. The effect of continuum fitting uncertainty on the three spike statistics: the spike width distribution (left panel), pCDDF (middle panel) and FPS (right panel). The blue, black and red solid curves represent the observed spike statistics obtained using a low continuum ( $F_{\rm cont} - \delta F_{\rm cont}$ ), the best fit continuum ( $F_{\rm cont}$ ) and a high continuum ( $F_{\rm cont} + \delta F_{\rm cont}$ ) respectively. The normalization of the FPS and pCDDF are sensitive to observed continuum placement. Continuum placement does not have strong effect on the peak of the spike width distribution. However, the spike width distribution is broader for the low continuum placement. We rescale the observed flux in the low and high continuum models to match with that from best fit continuum model. The "corrected" low and high spike statistics are now in good agreement with the spike statistics corresponding to the best fit continuum.

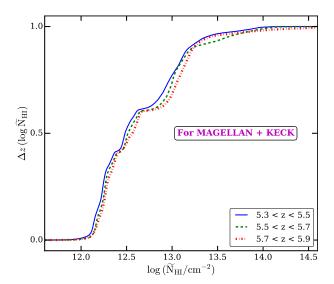


Figure A4. Calculation of sensitivity curve from observational sample in the three different redshift bins. The sensitivity curve is calculated by summing the total redshift path length in the observed spectra which lies below the limiting equivalent width. The limiting equivalent width is a theoretically expected equivalent width calculated from the curve of growth. The sensitivity curve is shown for a  $3\sigma$  detection level. The area under the sensitivity curve is used to calculate the H I pseudo-column density distribution function.

Fig. C2. We use simulations with varying box sizes and gas particle masses drawn from the optically thin Sherwood simulation suite (Bolton et al. 2017). All other parameters such as cosmology and the UVB evolution are same for the simulations. The spike statistics are well converged for our fiducial box size and mass resolution, which corresponds to the L40N2048 model.

Fig. C3 tests our method of constraining  $T_0 - \gamma$  from the spike width distribution using a  $\chi^2$  minimization process by evaluating the likelihood  $\mathcal{L} = \mathrm{e}^{-\chi^2/2}$ . The best fit model corresponds to a minimum  $\chi^2$  ( $\chi^2_{\min}$ ), where our  $1\sigma$  constraints on  $T_0 - \gamma$  are contours of constant  $\chi^2 = \chi^2_{\min} + \Delta \chi^2$  where we assume  $\Delta \chi^2 = 2.30$  for 2 degrees of freedom (Avni 1976; Press et al. 1992). To a good approximation, we confirm the  $\chi^2$  distribution in  $T_0 - \gamma$  plane is Gaussian.

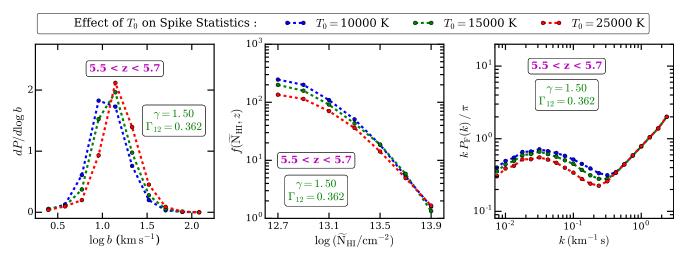


Figure B1. The effect of varying  $T_0$  on spike statistics, showing the spike width distribution (left panel), pCDDF (middle panel) and FPS (right panel).

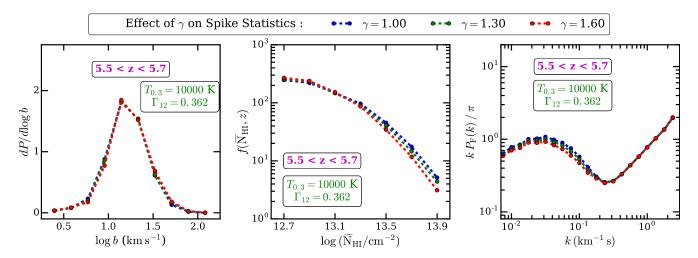


Figure B2. As for Fig. B1, except the effect of variation in  $\gamma$  on the spike statistics is illustrated.

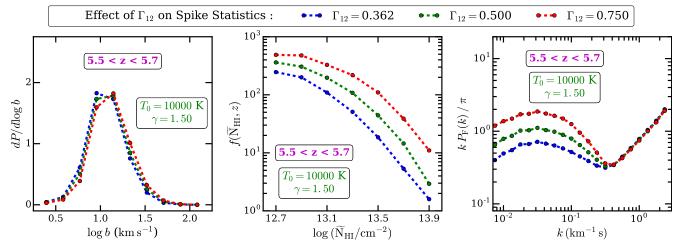


Figure B3. As Fig. B1 except the effect of variation in  $\Gamma_{12}$  on the spike statistics is illustrated.

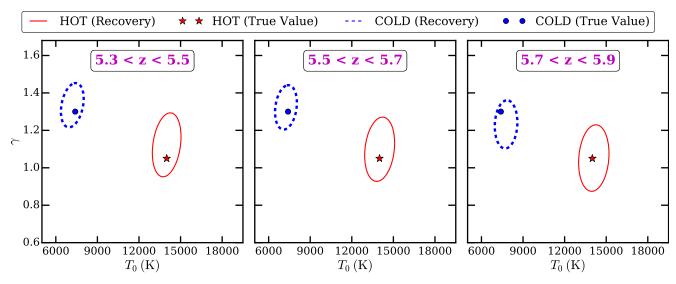


Figure B4. As for panel A in Fig. 9, except the recovery of  $T_0$  and  $\gamma$  from hot and cold model is illustrated. The TDR is varied using  $\Delta$  field from default model for a given value of  $T_0$  and  $\gamma$ . We use BPDF statistics to recover the  $T_0$  and  $\gamma$  from hot and cold model. We can recover  $T_0$  and  $\gamma$  within  $1\sigma$  for wide range of  $T_0$  and  $\gamma$ .

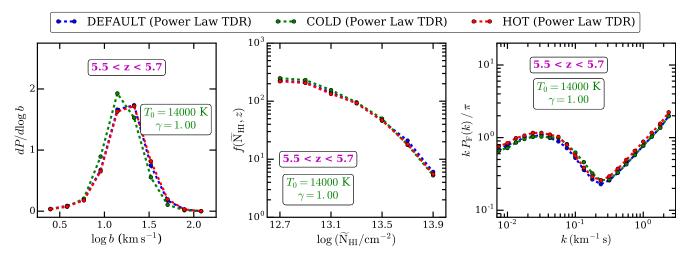


Figure B5. As for Fig. B1 except the effect of variation in the pressure smoothing scale on the spike statistics is illustrated.

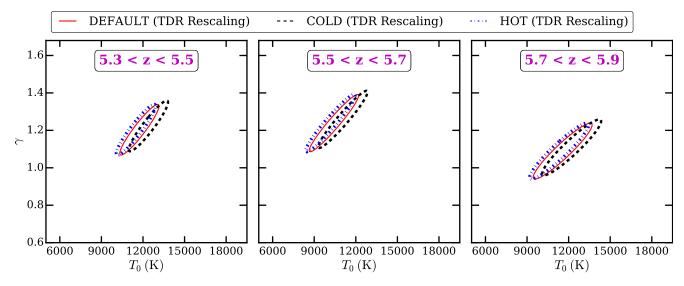


Figure B6. As for panel A in Fig. 9, except the effect of variation in the pressure smoothing scale on the  $T_0 - \gamma$  constraints is quantified in 3 redshift bins.

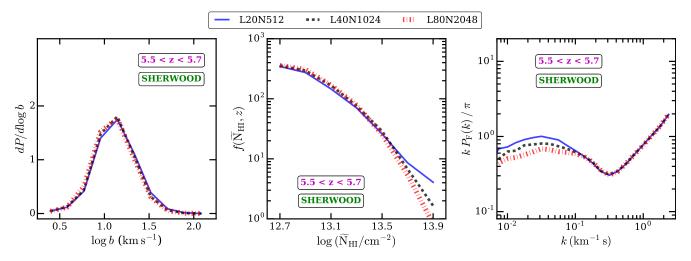


Figure C1. The effect of box size on the spike width distribution (left panel), pCDDF (middle panel) and FPS (right panel) in the Sherwood simulation suite at z=5.6, for box sizes of  $20h^{-1}\,\mathrm{cMpc}$  (L20N512),  $40h^{-1}\,\mathrm{cMpc}$  (L40N1024) and  $80h^{-1}\,\mathrm{cMpc}$  (L80N2048) at fixed mass resolution,  $m_{\mathrm{gas}}\sim7.97\times10^5\,\mathrm{M}_{\odot}$ . The results are relatively well converged for the three statistics except for the pCDDF in the L20N512 model at  $\log\widetilde{\mathrm{N}}_{\mathrm{HI}}>13.6$ .

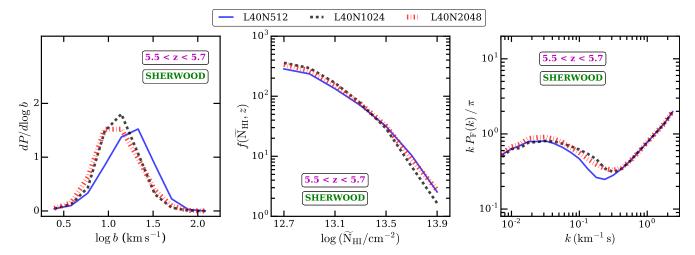


Figure C2. The effect of mass resolution on the spike width distribution (left panel), pCDDF (middle panel) and FPS (right panel) in the Sherwood simulation suite at z=5.6, for a gas particle mass of  $m_{\rm gas}\sim 6.38\times 10^6\,{\rm M}_{\odot}$  (L40N512),  $m_{\rm gas}\sim 7.97\times 10^5\,{\rm M}_{\odot}$  (L40N1024) and  $m_{\rm gas}\sim 9.97\times 10^4\,{\rm M}_{\odot}$  (L40N2048) for a fixed box size of  $40h^{-1}\,{\rm cMpc}$ . High mass resolution is important for correctly resolving the widths of the transmission spikes.

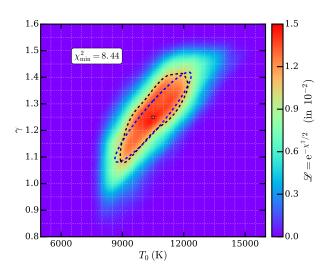


Figure C3. The likelihood  $\mathcal{L}=\mathrm{e}^{-\chi^2/2}$  obtained by comparing the simulated spike width distribution to observations at  $5.3 \leq z \leq 5.5$ . The best fit model corresponds to model with  $\chi^2_{\min}=8.44$  (yellow star). The black dashed line shows the contours of  $\chi^2_{\min}+\Delta\chi^2=10.7$  where  $\Delta\chi^2=2.30$  for 2 degrees of freedom ( $\chi^2_{dof}\sim1.05$ ). The blue dashed line shows  $1\sigma$  constraints on  $T_0-\gamma$  assuming  $\chi^2$  (and hence  $\mathcal{L}$ ) is Gaussian distributed. To a good approximation, the  $\chi^2$  distribution in the  $T_0-\gamma$  plane is Gaussian. The grid shows the sampling of points in  $T_0-\gamma$  plane used to obtain the  $\chi^2$  field.

This paper has been type set from a  $T_{\hbox{\it E}}X/{\rm L}^{\!\!A}T_{\hbox{\it E}}X$  file prepared by the author.