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# Lyman- $\alpha$ transmission properties of the intergalactic medium in the CoDaII simulation

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## ABSTRACT

The decline in abundance of Lyman- $\alpha$  (Ly $\alpha$ ) emitting galaxies at  $z \gtrsim 6$  is a powerful and commonly used probe to constrain the progress of cosmic reionization. We use the CoDAII simulation, which is a radiation hydrodynamic simulation featuring a box of ~94 comoving Mpc side length, to compute the Ly $\alpha$  transmission properties of the intergalactic medium (IGM) at  $z \sim 5.8$  to 7. Our results mainly confirm previous studies, i.e. we find a declining Ly $\alpha$  transmission with redshift and a large sightline-to-sightline variation. However, motivated by the recent discovery of *blue* Ly $\alpha$  peaks at high redshift, we also analyse the IGM transmission on the blue side, which shows a rapid decline at  $z \gtrsim 6$  of the blue transmission. This low transmission can be attributed not only to the presence of neutral regions but also to the residual neutral hydrogen within ionized regions, for which a density even as low as  $n_{\rm HI} \sim 10^{-9}$  cm<sup>-3</sup> (sometimes combined with kinematic effects) leads to a significantly reduced visibility. Still, we find that ~ 1 per cent of sightlines towards  $M_{1600AB} \sim -21$  galaxies at  $z \sim 7$  are transparent enough to allow a transmission of a blue Ly $\alpha$  peak. We discuss our results in the context of the interpretation of observations.

Key words: dark ages, reionization, first stars – intergalactic medium – galaxies: formation.

#### **1 INTRODUCTION**

While baryonic astrophysics in today's Universe is mainly governed by effects which are small-scale – for cosmological standards – this was not always the case. A few billion years ago, at  $z \sim 6$ the 'Epoch of Reionization' (EoR) was nearly complete. During this period, the vast majority of atoms in the Universe underwent the same transition: from neutral to ionized (for reviews, see e.g. Robertson et al. 2010; Mesinger 2016; Dayal & Ferrara 2018). While this approximate picture stands on relatively firm grounds – largely owing to the measurement of the Thompson optical depth by cosmic microwave background (CMB) experiments (Hinshaw et al. 2013; Planck Collaboration 2020) – the details are yet unclear. This is because the study of the EoR faces a number of challenges. On the observational side, because this period is so far away, thus, major obstacles do exist, for instance, for current and future 21cm experiments.

But also on the theoretical side, the study of the EoR is fairly challenging. Not only is it, as mentioned above, a baryonic process and consequentially rather messy – but it also spans a wide range of scales: the ionizing photons have to be produced (which can involve elaborate stellar modelling; e.g. Eldridge & Stanway 2016), then escape their birth cloud (e.g. Kakiichi & Gronke 2021; Kimm et al. 2019), and eventually the galaxy as well as its immediate surroundings (e.g. Dove & Shull 1994; Paardekooper, Khochfar & Dalla Vecchia 2015; Lewis et al. 2020); each of these steps requires in principle knowledge of sub-parsec baryonic physics. Afterwards, the ionizing radiation might traverse  $\gtrsim Mpc$  sized already ionized

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regions in order to affect neutral atoms far away from the source. Thus, requiring the consideration of truly cosmological scales.

In recent years, however, progress has been made on both frontiers. The observational constraints of the EoR are improving continuously. Apart from the previously mentioned integrated CMB constraints, quasar (Fan et al. 2006; Becker, Bolton & Lidz 2015; Bosman et al. 2018; Davies et al. 2018), and gamma-ray bursts (Chornock et al. 2013) spectra yield tighter, and tighter constraints. Measurements of galactic emission help to constrain the evolution of the ionized fraction better – mainly thanks to the Lyman- $\alpha$  (Ly $\alpha$ ) line (for a review, see Dijkstra 2014). The change in the Ly $\alpha$  equivalent width distribution, and the change in the clustering statistics of Ly $\alpha$  emitters are nowadays commonly used as astrophysical EoR constraints (Furlanetto, Zaldarriaga & Hernquist 2006; McQuinn et al. 2007; Kakiichi et al. 2016; Mason et al. 2018a; Ouchi et al. 2018).

This progress is built upon arduous observational work. While for decades, the detection of extra-galactic Ly $\alpha$  radiation was only conjectured (Partridge & Peebles 1967; Koo & Kron 1980) later hundreds of Ly $\alpha$  emitting galaxies (LAEs) were detected (e.g. Møller & Warren 1993; Hu, Cowie & McMahon 1998; Rhoads et al. 2000). Now this field is pushed towards higher redshift, and a continuously increasing amount and quality of Ly $\alpha$  data is available to the community (e.g. Fontana et al. 2010; Jung et al. 2018; Sobral et al. 2018; Hoag et al. 2019).

One particularly interesting development driven by new instruments and telescopes is the availability of high-resolution highsignal-to-noise Ly $\alpha$  spectra at  $z \gtrsim 5$  – unthinkable even just a decade ago. Thanks to this progress, it is now possible to study Ly $\alpha$  spectral properties even at these highest redshifts which lead to the somewhat surprising detection of *blue* Ly $\alpha$  peaks at  $z \gtrsim 6$  (Hu et al. 2016; Matthee et al. 2018; Songaila et al. 2018; Bosman et al. 2020). Surprising, because prior to that it was commonly assumed (e.g. in models constraining the progress of the EoR) that all flux blueward of the Ly $\alpha$  line is absorbed at this high-z due to the high neutral fraction of the IGM. Studying the detectability of blue peaks is one of the main focus of this work.

Not just on the observational front but also computationally the EoR community is making steady progress due to the ever increasing power of supercomputers. Several groups manage now to run hydrodynamical cosmological volume boxes with radiative transfer to follow the evolution of the ionizing regions closely (e.g. on the fly in Gnedin 2014; Rosdahl et al. 2018, or in post-processing in Kulkarni et al. 2019). This allows the community now to predict the evolution of observables as well as to estimate the scatter around these trends. One recent example of such simulations is the CoDAII (Ocvirk et al. 2020) simulation which uses the RAMSES-CUDATON code (Ocvirk et al. 2016).

In this work, we use the CoDAII simulation in order to study the evolution of Ly $\alpha$  observables at  $6 \leq z \leq 7$ . This simulation features full coupled ionizing radiative transfer as well as a representative volume to study the Ly $\alpha$  observables at hand. In particular, we focus on the disappearance of Lyman- $\alpha$  emitting galaxies (Lyman- $\alpha$  emitters; LAEs) at  $z \gtrsim 6$  due to the increasing neutral IGM, and how this intergalactic absorption affects the Ly $\alpha$  line shape. In contrast to earlier studies, we focus in particular on the detectability of blue peaks at these redshifts – motivated by the recent observations mentioned above.

This paper is structured as follows: in Section 2 we lay out our method, that is, we provide technical background of the Co-DAII simulation (Section 2.1), and explain how we generate the transmission curves (Section 2.2). In Section 3, we present our results, which we discuss in some context in Section 4, before we conclude in Section 5.

### 2 METHOD

#### 2.1 The CoDall simulation

The CoDAII simulation is a fully coupled radiation-hydrodynamical simulation of galaxy formation during the EoR. It was performed on Titan, at Oak Ridge National Laboratory, with RAMSES-CUDATON (Ocvirk et al. 2016). It is fully presented in Ocvirk et al. (2020) and therefore we recall here only the main points relevant to this study. The simulation describes the evolution of a box of  $\sim 94.5$ comoving Mpc (cMpc) on a side, i.e. large enough to model global reionization, from z = 150 down to z = 5.8 (see, however, Iliev et al. 2014, for a discussion of the required boxsize in order to capture EoR fluctuations). The simulation grid is 4096<sup>3</sup>, allowing us to resolve haloes down to  $10^8 M_{\odot}$  (with a dark matter particle resolution of  $\sim 4 \times 10^5 M_{\odot}$ ) and therefore providing a good sampling of the various halo masses contributing to cosmic reionization, as shown in Lewis et al. (2020). Another advantage of the CODAII simulation is that it contains a statistically representative population of massive haloes, up to  $10^{12}$  M<sub> $\odot$ </sub> at z = 6, owing to its very large volume. Since the mass of dark matter haloes in which objects with blue  $Ly\alpha$  peak mentioned above reside is unknown, it is crucial that our methodology allows us to investigate such a broad range of masses.

Also, CoDAII reproduces a number of observables of the high redshift Universe, in particular its reionization history (i.e. the evolution of  $x_{HII}$  with redshift), and the UV luminosity functions at z =6 and above, which are particularly important for the investigations presented in this paper. Finally, the spatial resolution (better than 3.3 kpc physical) is well suited to computing Ly $\alpha$  transmission spectra. However, such a cell size may seem to allow resolving self-shielded systems only marginally. Indeed, Rahmati & Schave (2018) showed that such systems are typically 1–10 pkpc at z =6-7. It is therefore possible that we are missing a contribution to opacity from those self-shielded systems below our resolution limit. While we cannot offer a clear way of quantifying such potential missing opacity from the simulation, we can try to gain some insight into this aspect from the resolution study of Ocvirk et al. (2019), fig. 7 and table 1. The latter quantifies the increase of residual neutral fraction after overlap in simulations with twice and four times the spatial resolution of CODAII, i.e. with 8 and 64 times higher mass resolution. The most resolved simulation in that study has 0.92 pkpc cell size, i.e. marginally resolving the minimum size quoted by Rahmati & Schaye (2018). If self-shielded systems are very sensitive to resolution and hold a large amount of the global HI, we should see a significant increase in the residual  $x_{\rm HI}$  when increasing resolution. Instead, the increase found is rather limited (about a factor of 2), despite increasing the mass resolution by a factor of 64. Following this argument, the amount of HI to account for unresolved self-shielded systems in CODAII could also be an order unity effect. Generally, combining large volumes with spatial resolution high enough to capture self-shielded systems remains a challenge, and thus also a limitation of our methodology. Cosmic Dawn III will provide interesting insight into this aspect, with a factor of two increase in resolution and an improved calibration (Lewis et al., in preparation).

CODAII performs explicit radiative transfer of ionizing radiation from one cell to another, across the simulation volume. However, the amount of ionizing radiation released by each star particle into the cell in which it forms was assumed to be reduced from the intrinsic photon luminosity of its stars by the bound–free Lyman continuum opacity of the unresolved, subgrid-scale interstellar birth-cloud of the stars. To account for this extra opacity, we adopted a fixed birth-cloud escape fraction of  $f_{LyC} = 0.42$  which the intrinsic stellar luminosity of each star was reduced when assigning an ionizing photon luminosity to the stars in each star particle. This value was tuned to reproduce a range of observables of the global ionization history, although it somewhat underpredicts the neutral fraction at the tail end of the EoR (see Ocvirk et al. 2020, for a full discussion). Notably, CoDAII does use the full speed of light in its ionizing radiative transfer routines, and, thus, does not suffer from problems stemming from the usage of the 'reduced speed of light approximation' (in combination with the M1 closure relation; Deparis et al. 2019; Ocvirk et al. 2019).

For the generation of the UV magnitudes cited ( $M_{1600AB}$ ) the BPASS  $Z = 10^{-3}$  binary population and spectral synthesis model was used (Eldridge et al. 2017), assuming no dust extinction.

#### 2.2 Generation of transmission curves

We analysed the simulation snapshots at  $z \sim \{5.8, 6, 6.26, 6.55, 7\}$ (with average neutral fractions of  $\log_{10}(\langle x_{\rm HI} \rangle) \sim \{-5.15, -4.92, -1.41, -0.64, -0.30\}$ ). At each of these snapshots, we randomly selected 50 haloes for each 0.5 magnitude bin with  $M_{\rm UV} < -18$ . For each halo, we drew random lines of sight for which we generated transmission curves around the Ly $\alpha$  wavelength. In particular,

(i) we cut out a spherical region  $< 1.5R_{200}$  (i.e. set all the cells within that radius to be fully ionized) around the halo position (as given by the halo finder), where  $R_{200}$  is the radius in which the average density is 200 times the mean matter density at that redshift (as defined in Ocvirk et al. 2020, equation 2). We chose the cutout of  $1.5R_{200}$  for a number of (connected) reasons. The main reason is that the circumgalactic medium (CGM) is believed to span 1-2 virial radii around each galaxy (e.g. Tumlinson, Peeples & Werk 2017) and current cosmological simulations are not able to resolve the cold neutral gas within it (Fielding et al. 2016; Liang, Kravtsov & Agertz 2016); in fact, it has been shown that the HI content of such simulations in the CGM is non-converged (Suresh et al. 2019: Hummels et al. 2019: Peeples et al. 2019: van de Voort et al. 2019). Since Ly $\alpha$  radiative transfer is dependent on smallscale structure within the HI (e.g. Neufeld 1991; Gronke et al. 2017) this non-convergence as well as underresolving these structures is highly problematic when performing a full  $Ly\alpha$  radiative transfer. We, thus, treat the radiative transfer processes within the interstellar and circumgalactic medium as a 'black box', and concentrate on the impact of the IGM. The second reason for the cutout is a more technical reason. Even if we could resolve all the HI structure within in the ISM and CGM perfectly, photons scattered within  $\lesssim 1.5R_{200}$ have a non-negligible probability to scatter back into the line of sight (Laursen, Sommer-Larsen & Razoumov 2011; Jensen et al. 2014), i.e. we could not treat the scattering process as absorption.

(ii) we compute the gas mass weighted mean velocity within  $< R_{200}$  which we use as systemic redshift for each halo, that is, effectively shifting all velocities with respect to this one.

(iii) we drew 100 random sightlines around each halo not intercepting any domain boundary. Along each, we calculate the transmission curve using trident (Hummels, Smith & Silvia 2017) taking the neutral hydrogen number density  $n_{\rm HI}$ , the temperature *T*, and the gas velocity **v** for each cell into account. We integrate from the halo position to a distance of  $5000 \,\mathrm{km \, s^{-1}} / H(z)$  away from the source which is sufficient to have converged transmission curve (see e.g. figure 1 of Mason & Gronke 2020). We tested this assumption by finding that a subset of the transmission curves were unchanged if we lowered this threshold to  $\sim 2000\,km\,s^{-1}$ .

In summary, this procedure allows us to be agnostic about the intrinsic line shape emergent from the  $Ly\alpha$  emitting galaxy.

#### **3 RESULT**

#### 3.1 Illustrative example sightlines

Fig. 1 shows some arbitrary transmission curves originating from a randomly chosen halo (left column) and in corresponding colour in the right column the neutral hydrogen number density as a function of distance from the source. This illustrates how  $Ly\alpha$  photons are absorbed in the IGM. At  $z \sim 7$  (lower row in Fig. 1), for instance, one notices the characteristic wing of the absorbing Voigt profile at  $v \gtrsim 200 \,\mathrm{km \, s^{-1}}$ . Furthermore, though, the transmission curves clearly exhibit some resonant absorption closer to  $v \sim 0$ . This is in spite of the fact that the edge of the ionized bubble is in this example for most sightlines at  $d \sim 6 \text{cMpc} \sim 640 \text{ km s}^{-1} / H(z)$ , i.e. too far shifted to be responsible for the resonant absorption. However, as can be seen in the right panel, inside this ionized region, patches of  $n_{\rm HI} \gtrsim 10^{-8} \,{\rm cm}^{-3}$  exist which are responsible for the resonant absorption. These patches can be fairly close to the emitting galaxy, and thus, likely infalling causing absorption even on the red side of the spectrum (Dijkstra, Lidz & Wyithe 2007; Iliev et al. 2008).

These patches with a 'large' HI number density of  $n_{\rm HI} \gtrsim 10^{-8} \, {\rm cm}^{-3}$  can cause resonant absorption also at lower redshifts which can be seen in the upper panels of Fig. 1. In these examples, the patches lead to a rather noisy Ly $\alpha$  transmission curve on the blue side.

Apart for the neutral region, and neutral patches inside the ionized region, also the residual neutral fraction inside the ionized bubbles can cause significant absorption. We illustrate this in the lower row of Fig. 1 where we modified one sightline by setting  $n_{\rm HI}$  (< 5 cMpc) = 0. The solid and dashed purple curve in Fig. 1 shows the unmodified and altered sightline, respectively. Clearly the region of wing absorption ( $\geq 200 \,\mathrm{km \, s^{-1}}$ ) is unchanged. However, due to the residual neutral part inside this region the spectrum blueward of ~ 200 km s<sup>-1</sup> shows zero transmission.

That even a small neutral hydrogen number density is sufficient in order to cause significant resonant absorption can be seen by this simple estimate:

$$n_{\rm HI} \sim \frac{\tau}{d\sigma_0} \sim \tau \frac{H(z)}{\sigma_0 v_{\rm core}}$$
 (1)

where  $\sigma_0$  and  $v_{\rm core}$  are the Ly $\alpha$  cross-section at line center and the width of the core region which take values of  $\sim 5 \times 10^{-14} \,{\rm cm}^2$  and  $\sim 80 \,{\rm km \, s^{-1}}$  at  $T \sim 10^4 \,{\rm K}$ , respectively (e.g. Dijkstra 2017). For  $z \sim 6 \,(z \sim 7)$  this yields  $n_{\rm HI} \sim 2 \times 10^{-10} \tau \,{\rm cm}^{-3} \,(\sim 4 \times 10^{-10} \tau \,{\rm cm}^{-3})$ . Equation (3) in Weinberg et al. (1997) is a more precise estimate which yields similar values. In Appendix A we investigate this numerically.

Fig. 2 illustrates the three different absorption causes. It shows a slice around a halo at  $z \sim 7$ . Clearly, the large remaining neutral regions are visible. Furthermore, also the remaining neutral absorbers inside the ionized regions can be seen. Most importantly, though, the neutral hydrogen number density even inside the ionized regions shows a lot of structure with only small patches exhibiting  $n_{\rm HI} \lesssim 10^{-9} \, {\rm cm}^{-3}$  required for a non-absorption at this redshift.



**Figure 1.** Examples of transmission curves (left-hand panels) and the corresponding neutral hydrogen number densities (right-hand panels) of an arbitrary halo at  $z \sim 6$  (top row) and  $z \sim 7$  (bottom row) with  $R_{200} \sim 0.3$  cMpc ( $M \sim 2 \times 10^{11} M_{\odot} h^{-1}$ ,  $M_{1600AB} \sim -22$  at  $z \sim 6$ ). The purple dashed lines in the lower row show an example where we set  $n_{\rm HI} (< 5 \text{ cMpc}) = 0$  for illustration purposes. The blue and red shaded region in the left column mark the  $50 < |v|/(\text{km s}^{-1}) < 400$  region which we use as 'blue' and 'red' side in the further analysis. In the right-hand panels, we mark the velocity corresponding to the Hubble flow of  $\sim 2 \text{ cMpc}$  at that redshift.

# 3.2 Lya transmission statistics

Fig. 3 shows the median and difference to the 16th and 84th percentile of the maximum transmission  $T_{\text{max,blue}}$  within  $v \in [-400, -50] \text{ km s}^{-1}$  which we define as the 'blue side'. The lower panel of Fig. 3 shows the integrated transmission in this wavelength range  $T_{\text{int,blue}} \equiv \int T(v) dv/\Delta v_{\text{blue}}$ . Several points are clear from Fig. 3: (*i*) at  $z \gtrsim 7$  essentially all Ly $\alpha$  transmission emergent on the blue side of the spectrum is absorbed by the IGM in the CODAII simulation with some rare peaks being transmitted, (*iii*) at  $z \sim 6$  some transmission on the blue side is allowed, (*iii*) but even at this later times there is a strong sightline-to-sightline variation for all the haloes, and (*iv*) overall, there seems to be no clear dependence on the UV magnitude.

Fig. 4 shows the same statistics but for the red side ( $v \in [50, 400] \text{ km s}^{-1}$ ) of the Ly $\alpha$  transmission curve. As expected, the overall transmission is much larger with a  $T_{\text{max, red}} \sim 1$  for  $z \leq 6$ , and even the integrated transmission reaching mostly  $\gtrsim 80$  per cent of its maximum value at  $z \sim 6$ . Also at higher redshifts a large fraction of the redward flux is transmitted reaching  $\sim 0 - 80$  per cent at  $z \sim 7$ . As for the blue side, we found a rather large sightline-to-sightline variation.

Note that in both Figs 3 and 4 we show only 100 randomly selected haloes for visualization purposes. Fig. 5 shows instead the full distribution for all the analysed haloes of these transmission statistics. Apart from the confirmation of the main findings stated above, the evolution in the transmission properties is clearly visible. In addition, there seems to be a slight brightness dependence of  $T_{\text{int., red}}$  with the more massive haloes having a larger probability that their Ly $\alpha$  is not transmitted on the red-side. We attribute this effect to the larger cosmological infall velocity (with respect to the (Ly $\alpha$ ) emitting regions) for these haloes which leads to an increased absorption on the red side (see Section 3.1). Though, note that Lya from these massive haloes may be emitted anyway with a larger velocity offset due to more scattering in the ISM (Shibuya et al. 2014; Stark et al. 2017; Mason et al. 2018a).

Another representation of the integrated transmission is shown in Fig. 6 – which, assuming an intrinsic Ly $\alpha$  equivalent width (EW) distribution and respective Ly $\alpha$  escape fraction – could be translated to an observed EW distribution of Lyman break galaxies. On the red side, the evolution from a bimodal distribution at  $z \sim 7$  to a unimodal distribution with most sightlines yielding  $T_{\text{int., red}} \sim 1$  at  $z \sim 6$  can be observed. The integrated blue transmission shows a non-negligible



**Figure 2.** Slice through the simulation around one  $M \sim 7 \times 10^{11} M_{\odot}$   $(M_{1600AB} \sim -21.1)$  halo at  $z \sim 7$  (marked with a white circled indicating  $2R_{200}$ ). The upper and lower panel shows the neutral hydrogen number density and the neutral fraction, respectively. The plots illustrate the different ways of absorption discussed in Section 3.1: (*i*) wing absorption by the large, remaining neutral regions; (*ii*) absorption through the neutral patches; or (*iii*) resonant absorption by the residual neutral hydrogen in the otherwise ionized regions.

tail with  $T_{\text{int., blue}} > 0$  which becomes more prominent at later times. As we discuss in Section 3.3 this tail is important for observed blue peaks at high-z.

Focusing on the red side (right column) of Fig. 6, it is interesting that at earlier times ( $z \sim 6.5$ ), the transmission statistics are more bimodal (see also Mesinger et al. 2015). I.e., the transmission is either very large or close to zero. This makes sense since at such high-*z* the T(v) is essentially a step function due to the large HI cross-section, and the fact that  $T \propto e^{-\tau}$ . Specifically, one can write  $T(v) \sim 0$  for  $v \leq v_{\text{cutoff}}$  where  $v_{\text{cutoff}}$  is commonly set by the infall velocity; as discussed in Section 3.1. This distribution might be relevant for searches of Ly $\alpha$  emitting galaxies which optimally should target as many sources as possible assuming a unity IGM transmission. At *z* 



**Figure 3.** IGM transmission on the blue side of 100 randomly selected haloes. Each point and error bars represent the median, 16th and 84th percentile drawn from 100 sightlines for each halo.

 $\gtrsim$  7, on the other hand, we find the integrated transmission peaks at 0.

Fig. 7 summarizes the redshift evolution of these statistics. Here, we show the percentiles of the medians for every halo as a function of redshift. We show both the maximum and normalized integrated transmission. Fig. 7 shows that the decline on the blue side is rather rapid with no flux transmitted at  $\gtrsim 6.5$ . The decline on the red side, on the other hand, is offset by  $\Delta z \sim 0.6$  towards higher redshifts.

In Fig. 8, we show the evolution of the fraction of sightlines with a *total* integrated (total) transmission >0.2 (within  $50 < |v|/(\text{km s}^{-1}) < 400$ ). Since this observed equivalent width is a product of the intrinsic equivalent width, the galactic Ly $\alpha$  escape fraction, and the integrated intergalactic transmission, this can be understood as the impact of the IGM on the 'Ly $\alpha$  emitter fraction'.<sup>1</sup> Between  $z \sim 6.5$  and  $z \sim 7$  we see a rapid decline for all halo sizes. The most UV luminous haloes show a slightly larger integrated transmission which is likely due to their larger virial radius, i.e. whether or not this signature holds will heavily depend on the CGM evolution (see the discussion Section 4.2 on that matter) – but could also be due to them residing in more ionized regions (Mason et al. 2018b).

<sup>&</sup>lt;sup>1</sup>The 'Ly $\alpha$  emitter fraction' is defined as the fraction of Lyman break galaxies with an Ly $\alpha$  EW above some threshold – usually 20 Å. Our choice of 0.2 as a cutoff is motivated by this, and a 'common' intrinsic Ly $\alpha$  EW of ~ 100 Å(Schaerer 2003).



**Figure 4.** IGM transmission on the red side of the 100 randomly selected haloes. Each point and error bar s represents the median, 16th and 84th percentile drawn from 100 sightlines for each halo.

#### 3.3 Comparison to observed blue peaks at high-z

Recently, several Ly $\alpha$  spectra at  $z \gtrsim 6$  with a prominent blue peak have been observed (Songaila et al. 2018). Specifically, 'Aerith B' (Bosman et al. 2020), 'COLA1' (Hu et al. 2016; Matthee et al. 2018), and 'NEPLA4' (Songaila et al. 2018) are well-studied examples which we want to compare to our findings.

'COLA1' is a luminous Ly $\alpha$  emitter at z = 6.59 located in the well-studied COSMOS field. Besides being exceptionally bright in Ly $\alpha$  (L<sub>Ly $\alpha$ </sub> = 4 × 10<sup>43</sup> erg s<sup>-1</sup>) it appears reasonably bright in the UV continuum with M<sub>UV</sub> = -21.6 ± 0.3. Contrarily to other galaxies with similar UV luminosity, COLA1 appears particularly compact (Matthee et al. 2018).

'NEPLA4' is a Ly $\alpha$  emitter at  $z \sim 6.54$  with a line shape resembling that of 'COLA1'. Since its location is in the currently less-studied NEP field the rest-frame UV magnitude is, unfortunately, unknown.

Lastly, 'Aerith B' is a bright  $(M_{AB} = -21.0^{+0.3}_{-0.2})$  Lyman-break galaxy at  $z \approx 5.79$  displaying strong Ly $\alpha$  emission  $(EW_{\text{rest}} = 64^{+39}_{-24}\text{Å})$ . Aerith B is situated within the ionization cone of a neighbourhing bright quasar at a distance  $d \sim 750$  proper kpc, with an estimated resulting UV intensity at its location of  $J_{21} = 406 \pm 40$ : a factor ~100 higher than the cosmic peak of the UVB. Unlike COLA1 and NEPLA4, the velocity separation between the red and blue peak of the Ly $\alpha$  line is large in Aerith B ( $\Delta v = (580 \pm 80) \text{ km s}^{-1}$ ), indicating the galaxy is unlikely a significant Lyman continuum leaker (Dijkstra, Gronke & Venkatesan 2016; Izotov et al. 2016).

Fig. 9 shows the spectra of these three objects (specifically from Songaila et al. 2018; Matthee et al. 2018; Bosman et al. 2020, from left to right) alongside with transmission curves of 'similar' haloes, i.e. within  $\pm 0.25$  UV magnitude of the  $M_{\rm UV} \approx -21.6$ and  $M_{\rm UV} \approx -21.0$  'COLA1' and 'Aerith B', respectively, have been associated with. In Fig. 9 we show the median transmission curve as well as the 16th and 84th percentile of the distribution stemming of 100 sightlines for the 25 [184] haloes falling in the right  $M_{\rm UV}$  range for 'COLA1' ['Aerith B']. It is clear that finding an object such as 'COLA1' or 'Nepla4' in the CoDaII simulation is extremely unlikely. On the other hand, while a  $Ly\alpha$  spectrum such as shown by 'Aerith B' is still far from common, it seems at least not entirely unlikely from Fig. 9. However, the median transmission curve can be misleading, and one should directly compare the impact of the IGM on the  $Ly\alpha$  spectral properties (for a detailed discussion of this effect, see Byrohl & Gronke 2020).

In Figs 10 and 11 we show the distribution of all the integrated flux on the blue side  $F_{\text{int., blue}}$  and the maximum width of a transmitted blue peak  $W_{\text{blue, max.}}(T > 0.5)$  (defined as an uninterrupted transmission T > 0.5), respectively. Specifically, we show the inverted cumulative distribution functions of the sightlines originating from similar haloes as 'COLA1', 'Aerith B', and 'NEPLA4'. Since, as described above, for the latter the UV magnitude is unknown, we use our full distribution at that redshift.

Figs 10 and 11 quantify the statement of 'extremely unlikely' made above better. Given the blue peak height observed and making the – quite optimistic – assumption of an intrinsically symmetric spectrum, one requires  $T \ge 0.5$  on the blue so in order to explain the observations. Fig. 10 shows that for such haloes this occurs in  $\sim 1 - 10$  per cent of all the sightlines. Maybe more revealing is Fig. 11 where we show the distribution of the maximum blue peak width transmitted at least 50 per cent by the IGM. In this figure, we also show as vertical lines the approximate blue peak width of the three observed objects studied. Due to the wide peak of 'Aerith B' the probability of finding an 'Aerith B' like object in CoDaII is  $\sim$  1 per cent. Inversely, since 'NEPLA4' shows a blue peak width of only  $\sim 80 \, \mathrm{km \, s^{-1}}$ , the probability of transmitting such a blue peak at this redshift is  $\sim 10$  per cent. Note, again, however, that due to the lack of UV information we show the full  $W_{\rm blue, max.}(T > 0.5)$  distribution at  $z \sim 6$ . We also caution that firstly the assumption made of the intrinsic spectrum might be unlikely itself since most Ly $\alpha$  emitters at lower redshift possess a mostly Ly $\alpha$  spectrum asymmetric towards the red side (e.g. Yang et al. 2016; Erb et al. 2014), and secondly the systemic redshift of the sources is unknown yielding the possibility of two red peaks being detected. We discuss these caveats and the likelihood of observing more blue peaks (or two red peaks) at high-z in Section 4.3.

Unlike COLA1 and NEPLA4, Aerith B is known a priori to be located in a very biased environment – an ionized quasar proximity zone – which is not captured by CoDaII due to the non-inclusion of quasars as ionizing sources. It is then interesting that the simulation predicts LAEs similar to Aerith B have a non-zero probability of being detected 'in the field' at z = 5.8. This may be related to the fact that CoDa II could overpredict J21 after overlap by a factor ~10, and similarly underpredicts the neutral fraction by the same factor (see Ocvirk et al. 2020, figure 3). Despite observations of LAEs being more extensive at  $z \sim 6$  than at  $z \sim 6.5$ , no other such objects are currently known.



Figure 5. Distributions of the transmission properties. Shown are the maximum transmission on the blue and red sides (first and second column, respectively), and the normalized integrated transmission on both sides (third and forth column). Each row represents a redshift as denoted on the left side. For representation purposes, each 2D histogram is normalized and the colour coding is logarithmically scaled.

# **4 DISCUSSION**

#### 4.1 Implications of core-scatterings in an ionized IGM

As we showed in Section 3, absorption in the core of the line due to neutral hydrogen atoms in the ionized regions of the IGM is responsible for a large fraction of the absorbed flux. They lead to essentially zero transmission on the blue side, and – due to cosmological infall – can also heavily affect the red side. This means that there is no simple relation anymore between the size of the ionized region, and the absorption pattern, and has, thus, several implications for the study of the EoR, which we want to discuss here.

The simple picture of the size of the ionized bubbles, and the cut-off of the Ly $\alpha$  line linked to the edge of the bubble often put forward in the literature is not valid anymore if there is a significant ( $n_{\rm HI} \gtrsim 10^{-10} \,{\rm cm}^{-3}$ ) neutral hydrogen component present. This is the case in the CoDAII simulation at  $z \gtrsim 6.5$ .<sup>2</sup> Instead, the visibility is mainly set by the (size of the) highly ionized regions around Ly $\alpha$  emitting sources with  $n_{\rm HI} \lesssim 10^{-10} \,{\rm cm}^{-3}$ , and the kinematics of the gas surrounding these galaxies. Due to the lack of quasars or other high-energy sources in CoDAII, the presence of these regions is mainly set by the redshift. This can be seen by the rapid development of the transmission on the blue side (cf. Section 3.2).

This affects all the Ly $\alpha$  observables commonly used to constrain the EoR, that is, the Ly $\alpha$  equivalent width distribution, LAE fraction, Ly $\alpha$  luminosity function, and the clustering statistics of LAEs.

# 4.2 Caveat: the omission of galactic and circumgalactic radiative transfer

The main caveat of this work is the focus on the transmission of the intergalactic medium, i.e. leaving out the Ly $\alpha$  radiative transfer processes in the ISM and CGM. Evolution of galactic and circum-galactic properties can change the Ly $\alpha$  escape fraction, and thus lower the observed Ly $\alpha$  luminosity. In particular, a lower Ly $\alpha$  escape fraction might mimic a lower IGM transmission, that is, a higher IGM neutral fraction / redshift.

Since Ly $\alpha$  photons are primarily destroyed by dust, two components can theoretically lower the Ly $\alpha$  escape fraction: (*a*) a larger dust content, and (*b*) a longer path-length of Ly $\alpha$  photons (through this dusty medium). While on an average larger dust content towards higher redshift seems unlikely, the latter option might be feasible. For instance, a lower ionization background leads to a larger HI column density in the CGM, thus increasing the path-length of Ly $\alpha$  photons. This scenario was discussed in Sadoun, Zheng & Miralda-Escudé (2017), who manage to reproduce the observed drop in the Ly $\alpha$  emitter fraction (e.g. Stark, Ellis & Ouchi 2011; Treu et al. 2013; Schenker et al. 2014).

However, while this scenario lowers the Ly $\alpha$  escape fraction, and consequently, the observed equivalent widths in agreement with observations, it also changes the other Ly $\alpha$  observables. In particular, a larger optical depth / path-length leads to an increased frequency

<sup>&</sup>lt;sup>2</sup>The abundance of sinks of ionizing photons such as Lyman limit systems and the boxsize do affect these low neutral fractions (Iliev et al. 2014).



Figure 6. Normalized sightline distribution of integrated transmission split by UV magnitude and red / blue side. The colour coding corresponds to different redshifts.



**Figure 7.** Evolution of transmitted maximum and integrated flux (circles and squares, respectively) on the red and blue side (in the corresponding colour) of all the selected haloes. Each point and error bars show the 16th, 50th and 84th percentile of the medians, i.e. represent the scatter between the sightlines. The secondary *x*-axis on top of the plot shows the volume averaged neutral fraction of the CoDaII simulation at the respective redshifts.



**Figure 8.** Evolution of fraction of haloes with total  $T_{\text{int.}} > 0.2$  (i.e.  $|v| < 400 \text{ km s}^{-1}$ ). Shown are only the  $M_{\text{UV}}$  bins with at least 10 haloes.

diffusion, and hence, wider Ly $\alpha$  lines (e.g. Neufeld 1990). This seems in tension with observed Ly $\alpha$  spectra at high-*z* (Hu et al. 2010; Ouchi et al. 2010; Pentericci et al. 2018; Matthee et al. 2020), but further study is required to come to a firm conclusion.

While one solution to the caveat might seem the inclusion of the ISM & CGM into the radiative transfer calculations, we deliberately chose not to do so in this study. As preluded in Section 2.2, this is mainly due to three reasons: (i) Ly $\alpha$  radiative transfer is sensitive to sub-parsec structure inside the neutral hydrogen, such as its clumpiness (e.g. Neufeld 1991; Gronke et al. 2017), (ii) this structure exists (e.g. in the CGM Rauch, Sargent & Barlow 1999: Lan & Fukugita 2017) and (iii) CODAII (as similar simulations) cannot resolve these scales in the ISM or CGM. In summary, while the ISM or CGM do have an effect on the Ly $\alpha$  line we do not resolve the relevant scales here, so we only consider the IGM effects. In fact, the inability to reproduce  $Lv\alpha$  spectra of radiative transfer simulations using highresolution galactic simulations might be due to this issue (see discussion in Gronke et al. 2017). Instead, we chose to follow a 'Russian doll' approach to tackle the multiscale problem of modelling Ly $\alpha$  observables, and focus on the intergalactic part in this study.

# 4.3 Allez les bleus: the curious cases of blue Lyα peaks at high-z

In Section 3.3 we compared our findings to observations of blue Ly $\alpha$  peaks at  $z \gtrsim 6$ . Specifically, we analysed the observed spectra of 'Aerith B' (Bosman et al. 2020), 'COLA1' (Hu et al. 2016; Matthee et al. 2018), and 'NEPLA4' (Songaila et al. 2018; cf. Fig. 9). Other authors did claim a detection of a blue Ly $\alpha$  peak at high redshift, such as the ~ 450 km s<sup>-1</sup> blueshifted peak at  $z \sim 9.1$  described in Hashimoto et al. (2018). However, due to a lack of a (dominant) red peak, this is less certainly Ly $\alpha$  compared to the three objects we focused on here. Similarly, Songaila et al. (2018) present more 'complex' Ly $\alpha$  profiles with a blue wing – but not necessarily a clear blue peak. Better spectral resolution and sensitivity will help to clearly show which of these are blended peaks.

In the analysis presented in Section 3.3, we concluded that an IGM transmission required in order to observe these cases occurs in only a few per cent of the sightlines in CoDAII (mostly where motions allow for a blueward transmission). The crucial assumption leading to this number is the intrinsic symmetry of the Ly $\alpha$  spectrum. For lower redshift Ly $\alpha$  emitting galaxies, we know that in fact most Ly $\alpha$  lines are asymmetric towards the red side. At  $z \sim 0.3$  high-resolution



**Figure 9.** Ly $\alpha$  spectra of 'NEPLA4', 'COLA1', and 'Aerith B' (from left to right panel) with the median (and 16th to 84th percentiles as shaded region) transmission curves of similar haloes in CoDaII. Specifically, the central [right] panel shows sightlines (100 per halo, maximum of 200 haloes) originating from haloes within ±0.25 magnitude of the observed value at z = 6.55 [z = 5.8].



Figure 10. Inverse cumulative distribution function of the integrated flux on the blue side for haloes similar to 'COLA1', 'Aerith B', and 'EPLA4'.



Figure 11. Inverse cumulative distribution function of the maximum width of a transmitted peak on the blue side.

spectroscopy of high-redshift analogues suggests that less than half of the flux is emerging on the blue side.<sup>3</sup> At higher redshifts, lower spectral resolution makes clear distinction in a statistically significant sample harder. Erb et al. (2014) found in their sample of 36 LAEs and 122 LBGs at  $z \sim 2-3$  that only 6 possess a dominant blue side. Trainor et al. (2015) later quantified this number to be ~ 10 per cent in their extended sample of 350 LAEs and 65 LBGs at the same redshift. They also measured in ~ 45 per cent of the galaxies any blue peak with both fractions being same for their LAE and LBG sample. Similarly, Herenz et al. (2017) report that ~ 35 per cent of the 237 from the MUSE Wide survey show a blue peak, and Yamada et al. (2012) find that approximately half their sample of 91 Ly $\alpha$  emitting galaxies at  $z \sim 3.1$  possess a double peak.

Following this evolution, at higher redshift this ratio might become tilted even more towards the blue. In fact due to a larger gas infall at these early epochs some  $Ly\alpha$  radiative transfer studies using cosmological simulations find spectra with all or most of the flux emerging on the blue side (e.g. Laursen, Razoumov & Sommer-Larsen 2009; Zheng et al. 2010). However, since simulations like these fail thus far to reproduce the  $Ly\alpha$  spectral properties at lower redshift mentioned above (see comparison by Gronke et al. 2018), it is yet unclear whether this holds. Also, other observational quantities such as the large Ly $\alpha$  equivalent widths of LAEs at  $z \gtrsim 6$  are hard to reconcile with the picture that a majority of the flux (on the blue) is absorbed by the IGM (Matthee et al. 2017). Nevertheless, the degeneracy between radiative transfer processes on galactic scales, and the IGM do exist (also see discussion in Section 4.2). Recently, Byrohl & Gronke (2020) have suggested a probe to break this degeneracy by the detection of multiple blue peaks, which might be feasible in the near future.

In conclusion, it is most likely that our assumption of a symmetric intrinsic spectrum is an oversimplification, and in reality the red peak in  $z \gtrsim 6$  galaxies is dominant. This would decrease the number of observable blue peaks in CoDAII even further. For instance, if the

<sup>3</sup>For instance, the 12 'Green peas' (Henry et al. 2015; Yang et al. 2016) with Ly $\alpha$  spectrum taken show in ~ half the galaxies a clear blue peak with always a dominant red size, and the 13 'LARS' galaxies (Östlin et al. 2014; Hayes et al. 2014; Rivera-Thorsen et al. 2015) with Ly $\alpha$  emission suggest have only ~ one clearly detectable blue peak – which has still more flux on the red side.

average asymmetries of Ly $\alpha$  emitters with a blue peak of  $\gtrsim 2/3$  of the flux being emitted on the red side (approximately consistent with the lower z studies mentioned above) holds, we would require  $T_{\text{int., blue}}$  close to unity to explain the observations.

In this study, we compared out findings to three individual galaxies with significant blue flux. Due to a lack of high-resolution  $Ly\alpha$  spectra it is too early too say how common such objects are; however, Songaila et al. (2018) state that 'roughly a quarter (two out of eight) of the LAEs have complex profiles with apparent blue wings' (note, however, that observations carried out using the 'Hyper-suprime cam' on the Subaru telescope suggest a lower blue peak fraction at high-*z*, although, no thorough analysis has been performed; Shibuya et al. 2014; Harikane et al. 2019). While this number is almost an order of magnitude larger than what we find here, there might be other reasons behind some of the detections.

As mentioned in Matthee et al. (2018), it is also thinkable that the observations of a double peak at high-*z* is not a red and a blue peak but instead two red peaks. This could be due to either two intrinsically emitted red peaks, or a wide red peak plus an absorption feature. While double backscattering causes nominally two red peaks,<sup>4</sup> the separation of these peaks is too small to yield two distinctive peaks; instead, they are blended causing merely an additional 'bump' towards the red (as e.g. in Matthee et al. 2020). In addition, in such a scenario the peak towards the blue is expected to be stronger.

However, the second case, i.e. the wide emission plus an absorption, might be more feasible and is in fact the case discussed extensively in Matthee et al. (2018). While at lower redshift a similar spectrum has not been observed<sup>5</sup> the increasing number density of absorbing systems towards higher redshift (Songaila & Cowie 2010; Noterdaeme et al. 2012; Crighton et al. 2015) might account for this. In Fig. 12 (as squares and dashed lines), we show the likelihood of such an event occurring leading to the observation of a 'blue' peak. Specifically, we demand that the red (blue) side is at least  $150 \text{ km s}^{-1}$  (100 km s<sup>-1</sup>) wide with a transmission of T(v)> 0.7 (>0.3) and separated by at least 30 km s<sup>-1</sup> and a maximum of 300 km s<sup>-1</sup>.<sup>6</sup> Clearly, given the number of parameters involved in such a scenario, this is merely an example, and we chose the parameters to be conservative, i.e. demanding more realistic (wider) peaks or a larger peak separation will lower the number of 'fake' blue peaks. However, Fig. 12 shows that even with this choice of parameters such an event occurring is quite unlikely at all redshifts considered, especially towards higher z. Nevertheless, for  $z \leq 6$ the probability is non-negligible highlighting the importance of systemic redshift measurements which can distinguish between these scenarios (see discussion in Matthee et al. 2018).

Fig. 12 also shows the probability of observing a 'real' blue peak, i.e. at v < 0 with the same parameters as above. As discussed before,

<sup>4</sup>This is due to the fact that in a 'backscattering' event a Ly $\alpha$  photon's frequency is boosted by  $\sim 2v$  where v is the bulk velocity of the scattering medium.

<sup>5</sup>Detections of indisputably triple peaked spectra are very rare. The 'Sunburst Arc' (Rivera-Thorsen et al. 2019) and 'Ion2' (Vanzella et al. 2019) are two recent examples from  $z \sim 2 - 3$  (also see Vanzella et al. 2018; Izotov et al. 2018, for two more examples at different z). Both exhibit a peak at line-center, though, and thus are of different nature than the double peaked detections at  $z \gtrsim 6$  but the at least spectrum of 'Ion 2' could likely be altered by intervening absorbers.

 $^{6}$ Note that the separation here is not exactly between the peaks but the distance in velocity space between the points where the transmission falls below and raises above the 0.7 and 0.3 thresholds, respectively.



**Figure 12.** Fraction of blue peaks detectable. The *circles* and *solid* lines show the fraction of 'real' blue peaks, i.e. in the range  $v \in [-50, -400] \text{ km s}^{-1}$ , the *squares* connected by *dashed* lines show 'fake' blue peaks, i.e. when an intervening absorber could have caused a double peaked detection – even with two red peaks. See Section 4.3 for details.

at  $z \gtrsim 6.5$  the likelihood is in the per cent-level. Noteworthy is the dependence on UV magnitude with a higher probability to see a blue peak in larger haloes. After the study of several individual skewers, we attribute this to the fact that a larger surrounding is cut-out around these objects due to a larger virial radius; implying whether or not this effect is real is linked to the CGM problematic discussed in Section 4.2. Furthermore, we note that in all the cases where a blue peak would be visible, the transmission curve is still a step function as discussed previously but with  $v_{\text{cutoff}} < 0$  due to relative motions between the emitting regions and the gas at larger radii. Whether this is realistic, e.g. due to large-scale outflows, or infalling galaxies into a potential well, depends highly on (*i*) what the emitting regions are, and (*ii*) how much radiative transfer processes act altering the surface brightness. While we do not address this in detail in this study (see Section 4.2), this is an interesting direction for future studies.

#### 4.4 Comparison to previous work

Previous work on the impact of the IGM on the Ly $\alpha$  line shape can be grouped into three categories:

(i) (Semi-)Analytical work which uses a simplified model of the IGM to compute the transmission spectrum. Notable examples of this category are, e.g. Santos (2004) or Dijkstra et al. (2007), which found the importance of cosmological infall leading to absorption on the red part of the spectrum. They also highlight the impact of the size of the ionized region around Ly $\alpha$  emitters – which they usually assume to be fully ionized.

(ii) Work which extends on the first category by not assuming certain 'bubble sizes' but using the input of seminumerical simulations based on an excursion set method such as 21cmFAST (Mesinger, Furlanetto & Cen 2011) in order to map halo masses and redshift to bubble sizes. This approach is very powerful as it is relatively fast, and can, thus, be used to map observations of  $Ly\alpha$  observables such as the EW distribution to different reionization histories and eventually constrain the global ionization fraction as, e.g. done in Mason et al. (2018a); Mason et al. (2019b, 2019a). One can combine dark-matter only or hydrodynamic cosmological simulations with ionizing radiative transfer in post-processing or using the semianalytical ionization techniques (as recently done in, e.g. Weinberger et al. 2018). Importantly, in these later, seminumerical models the ionized regions are set to a constant ionized fraction (usually set by photoionization equilibrium Meiksin 2009).

(iii) There has also been an approach which simulated the EoR by post-processing large cosmological *N*-body simulations (e.g. McQuinn et al. 2007; Iliev et al. 2008; Jensen et al. 2013) or hydrodynamical simulations (e.g. Laursen et al. 2011; Laursen et al. 2019). Commonly, ionizing luminosities are assigned to each *N*-body halo and ray-traced across the density field of the intergalactic gas outside haloes. Iliev et al. (2008), e.g. used this approach to analyse the effect of intergalactic Ly $\alpha$  transmission on LAE observations in a simulation box more than ~100 Mpc on a side, confirming the effect of intergalactic infall surrounding massive galaxies mentioned above. They also found that HII regions surrounding bright LAEs were filled with lower mass haloes clustered around the central galaxy which were also important ionization sources. They note that these 'proximity zones' can lead to transmission on the blue side by  $z \leq 7$ .

(iv) Lastly, there is the approach using a full radiationhydrodynamics simulation as input, as done in this study (also see e.g. recent work by Garel et al. 2021; Park et al. 2021). Naturally, other studies employed this approach before us (e.g. Gnedin & Prada 2004) using different simulations as input. An advantage of these studies is a more realistic ionization morphology on small-scales affected by hydrodynamical backreaction, and better resolved fluctuations inside the ionized regions. A disadvantage of these earlier studies is that they come from much smaller simulation domains, too small to model the large-scale patchiness of reionization realistically, and with resolution too limited to resolve the smaller mass haloes that can contribute significantly to reionization, even in the neighbourhood of bright LAEs.

Overall, the findings of these previous studies are fairly consistent (e.g. in pointing out the large sightline-to-sightline variation, or the effect of infall) with differences owing to the specific choice of parameters. Previous work did not, to our knowledge, discuss the effect the IGM transmission on the blue side has on the observable Ly $\alpha$  line properties and, thus the associated importance of the residual neutral fraction – and its fluctuations – of the ionized regions in observing objects like COLA1 – but instead focused more on the global observables such as the LAE clustering, Ly $\alpha$  luminosity function, and EW distributions, and the effect the intrinsic line shape has on these statistical measures (see, in particular, Jensen et al. 2013, who used Gaussian as well as double peaked profiles as intrinsic spectrum).

Clearly, all of the approaches have their own advantages and disadvantages and bring progress in different ways. For instance, recently Mason & Gronke (2020) analysed the importance of the residual neutral fraction, and its impact on the blue side of the Ly $\alpha$  spectrum, in a simplified model [category (*i*) or (*ii*) above] and demonstrate under which conditions a blue peak is observable.

As we argue in Section 4.3, the occurrence of blue peaks at high-*z* is an interesting new way of testing simulations of the EoR against observations. Current full radiation-hydrodynamics simulations with focus on reionization, include large boxes – to the sacrifice of spatial resolution – such as CODAII, and smaller ( $\leq 10$ cMpc) boxes focusing on a selected number of haloes with higher spatial resolution (e.g. Rosdahl et al. 2018; Wu et al. 2019). In principle,

all these simulations can be tested against  $Ly\alpha$  observables, and in particular the occurrence of blue peaks. We see, however, three main obstacles which we want to caution against: (i) although some of the simulations have better resolution, as already discussed above, this is thus far still not enough to achieve convergence in HI (circum-)galactic properties, and hence to resolve structures likely relevant for full Ly $\alpha$  radiative transfer, (*ii*) naturally, in order to compare with observations of galaxies residing in more massive haloes such as 'Cola1' (i.e.  $M_{\rm UV} \lesssim -21$  at  $z \gtrsim 6$ ), a statistical relevant sample of such haloes is required setting a minimum boxsize, and (iii) as we found the Ly $\alpha$  transmission (in particular on the blue side) is sensitive to the fiducial neutral fraction which, hence, needs to be captured correctly by simulations in order to use this observable as a probe of the EoR. This raises a potential issue with the commonly used 'reduced speed of light approximation,' which is a numerical ingenuity to decrease the computational cost of radiative transfer in simulations but affecting the residual neutral fraction after overlap, as shown in Ocvirk et al. (2019).

In this wide landscape of theoretical realizations, CoDAII's main advantages are its size and the use of the full speed of light. What is striking, though, is that CoDAII is too transparent as compared to the Fan et al. (2006) measurements (as shown and discussed in Ocvirk et al. 2020), but still not transparent enough to yield a large abundance of blue-peaked LAEs. Reproducing both of these aspects has never been done, and seems difficult, as we can judge from this study. It will certainly be an interesting challenge for future numerical simulations of the EoR.

#### 5 CONCLUSION

We analysed the Ly $\alpha$  transmission properties of the CO-DAII simulation which is a modern cosmological radiationhydrodynamics simulation. Our findings can be summarized as follows:

(i) The transmission of blue Ly $\alpha$  flux rapidly declines with increasing redshift, due to residual neutral gas inside ionized bubbles which can lead to complete absorption for  $n_{\rm HI} \gtrsim 10^{-9} \,{\rm cm}^{-3}$  at  $z \gtrsim 7$ ,

(ii) There is large sightline variation in blue flux transmission, but no clear  $M_{\rm UV}$  dependence. This is mainly due to kinematic effects, i.e. outflows and/or a relative motion of the emitting galaxy to the surrounding IGM gas. Whether this holds in reality depends strongly on the circumgalactic gas, which we ignore in our analysis, as discussed in Section 4.2.

(iii) The transmission on the red side is greater than the blue side, but also has high sightline variation, in particular at  $z \gtrsim 6.5$  when the transmission can vary from zero to unity for a given galaxy.

(iv) Te observed prevalence of blue peaks can provide an additional test for reionization simulations, but better observational statistic are required in order to do so. In CoDAII, we find for  $M_{1600AB} \sim -21$  galaxies, the opacity of the IGM allows the transmission of blue peaks through  $\sim 20$  per cent ( $\sim 1$  per cent) of lines of sight at  $z \sim 6$  ( $z \sim 7$ ).

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# DATA AVAILABILITY

Data related to this work will be shared on reasonable request to the corresponding author.

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# APPENDIX A: CHANGING THE FIDUCIAL NEUTRAL FRACTION

Fig. A1 shows transmission curves for homogeneous neutral hydrogen number densities, and no peculiar motion at  $z \sim 7$  (but an unchanged temperature). The estimate of  $n_{\rm HI} \sim 2 \times 10^{-10} \tau \,{\rm cm}^{-3}$  (cf. Section 3) fits this result fairly well.



Figure A1. Transmission curves for an homogeneous IGM at  $z \sim 7$ .

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