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### Authors

Graus, Andrew

Bullock, James

Boylan-Kolchin, Michael

et al.

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## Through a Smoother Lens: An expected absence of LCDM substructure detections from hydrodynamic and dark matter only simulations

Andrew S. Graus<sup>1,★</sup>, James S. Bullock<sup>1</sup>, Michael Boylan-Kolchin<sup>2</sup>, and Anna M. Nierenberg<sup>1</sup>

<sup>1</sup>Center for Cosmology, Department of Physics and Astronomy, 4129 Reines Hall, University of California Irvine, CA 92697, USA

<sup>2</sup>The University of Texas at Austin, Department of Astronomy, 2515 Speedway, Stop C1400, Austin, Texas 78712-1205

### Abstract

A fundamental prediction of the cold dark matter cosmology is the existence of a large number of dark subhalos around galaxies, most of which should be entirely devoid of stars. Confirming the existence of dark substructures stands among the most important empirical challenges in modern cosmology: if they are found and quantified with the mass spectrum expected, then this would close the door on a vast array of competing theories. But in order for observational programs of this kind to reach fruition, we need robust predictions. Here we explore substructure predictions for lensing using galaxy lens-like hosts at  $z=0.2$  from the Illustris simulations both in full hydrodynamics and dark matter only. We quantify substructures more massive than  $\sim 10^9 M_\odot$ , comparable to current lensing detections derived from *HST*, Keck, and ALMA. The addition of full hydrodynamics reduces the overall subhalo mass function by about a factor of two. Even for the dark matter only runs, most ( $\sim 85$  per cent) projections through the halo of size close to an Einstein radius contain no substructures larger than  $10^9 M_\odot$ . The fraction of empty projections through the halo rises to  $\sim 95$  per cent in full physics simulations. This suggests we will likely need hundreds of strong lensing systems suitable for substructure studies, as well as predictions that include the effects of baryon physics on substructure, to properly constrain cosmological models. Fortunately, the field is poised to fulfill these requirements.

### Keywords

cosmology; theory – galaxies; dwarf – galaxies; high-redshift

## 1 INTRODUCTION

One key prediction of the current paradigm of galaxy formation is that there should be some dark matter halo mass below which galaxies are unable to form (Klypin et al. 1999; Moore et al. 1999; Bullock & Boylan-Kolchin 2017). For example, if the (cold) dark matter particle is a neutralino, then substructure should exist down to masses of order  $10^{-6} M_\odot$ , depending

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★agraus@uci.edu

on details of the model (Green, Hofmann & Schwarz 2004). The halo mass at which galaxy formation is cut off should be many orders of magnitude higher than this. The specific cutoff scale depends on the complicated interplay between gas cooling and heating by an ultraviolet background but current estimates suggest that the mass scale is between  $10^8$  and  $10^9 M_{\odot}$  (Efstathiou 1992; Bullock, Kravtsov & Weinberg 2000; Bovill & Ricotti 2009; Sawala et al. 2016b; Oñorbe, Hennawi & Luki 2016). The implication is that if Cold Dark Matter (CDM) is the correct model, there should be numerous small dark matter halos with no galactic counterparts. As there is currently no detection of a dark matter particle the presence of such dark halos is a great way to constrain dark matter models.

Low-mass dark halos that exist within the virial radius of larger halos are known as subhalos and many techniques have been proposed to detect them. These include searches for gaps or other features in stellar streams in the Galactic halo (Johnston, Spergel & Haydn 2002; Ibata et al. 2002; Carlberg 2009; Bovy, Erkal & Sanders 2016), and via the detection of products in the annihilation of dark matter particles into standard model particles (Kuhlen, Diemand & Madau 2008; Ng et al. 2014; Sánchez-Conde et al. 2011). One additional promising avenue for detecting dark substructure is from strong lensing (Mao & Schneider 1998; Metcalf & Madau 2001; Dalal & Kochanek 2002).

The detection dark substructure via lensing is in principle straightforward. First, a suitably lensed object is detected, the foreground lens is modeled with a smooth potential for the host galaxy, and then perturbations are added to the foreground lens model in the form of potentials of possible dark matter substructure. Several systems have been analyzed with the hopes of detecting a subhalo, resulting in the detection of dark matter substructure at the  $\sim 10^9 M_{\odot}$  mass scale for galaxy-galaxy lensing (Vegetti et al. 2012; Hezaveh et al. 2016), and  $\sim 10^{7.5} M_{\odot}$  from quasar flux ratio anomalies (Nierenberg et al. 2014). This has allowed the authors to put constraints on the subhalo mass function and the fraction of mass that is in substructure. With current technology these methods could push down even further to  $M_{600} \sim 10^7 M_{\odot}$ , however no structures that small have been detected (Nierenberg et al. 2017).

The field of substructure lensing is intriguing because there is great potential in the near future for a substantial increase in the number of lenses and the ability to detect smaller objects. The Dark Energy Survey (DES), LSST, Euclid, and WFIRST will lead to an enormous increase in the number of lensing systems appropriate for looking for dark substructure. As an example, Collett (2015) estimates that DES, LSST and EUCLID will potentially discover 2400, 120,000 and 170,000 galaxy-galaxy lensing systems respectively. Currently, ALMA has the capability to detect very small substructure, potentially probing subhalo masses of  $10^6 M_{\odot}$  (Hezaveh et al. 2016). Furthermore, JWST will allow for detections at ( $\approx 10^7 M_{\odot}$ ) in halo mass, based on quasar flux ratio anomalies (MacLeod et al. 2013). However, without accurate predictions for what is expected within CDM, these observational constraints will never reach their scientific fruition.

Up until just a few years ago, simulating large numbers of galaxies with full hydrodynamics at high resolution was not possible. Therefore, theoretical studies of substructure lensing have used dark-matter-only simulations as their benchmark for comparison (e.g. Vegetti et al. 2014). Recent simulations of Milky Way type galaxies have shown that full

hydrodynamic simulations produce significantly fewer bound substructures than their dark matter only counterparts (Brooks & Zolotov 2014; Wetzel et al. 2016; Zhu et al. 2016; Sawala et al. 2016a; Garrison-Kimmel et al. 2017), with a factor of  $\sim 2$  reduction within the virial radius and an order of magnitude fewer subhalos within  $\sim 20$  kpc of the central galaxy. The primary cause appears to be the enhanced central potential created by the host galaxy: subhalos get destroyed as they approach the central galaxy on radial orbits. While this result is potentially of interest for subhalo lensing, most of the highest resolution simulations have been run at the Milky Way mass scale ( $\sim 10^{12} M_{\odot}$ ), as opposed to the mass scale used for substructure lensing studies which is closer to halo masses of  $10^{13} M_{\odot}$ . Fortunately, such simulations are just becoming feasible both in zoom-in simulations (Fiacconi et al. 2016) and in full box simulations, such as the EAGLE simulation (Schaye et al. 2015), and the Illustris simulation (Vogelsberger et al. 2014). This allows for studies of lensing substructures in simulations with full hydrodynamics. One example of this is Despali & Vegetti (2016) who use the EAGLE simulation (both dark matter only and full hydrodynamics), and Illustris hydrodynamics simulation to investigate predictions for subhalo lensing. They find that hydrodynamic simulations decrease the average expected substructure mass fractions, as would be expected from results on the Milky Way scale.

The present paper expands upon this past work by presenting the distributions of substructure mass fractions seen in projection along random axes through the host halos in the Illustris and Illustris-Dark simulations. We compare to the distribution inferred from the Vegetti et al. (2014) study as well projected substructure mass functions derived from Hezaveh et al. (2016). We explore how the distributions change as we go from dark matter only to full hydrodynamics to illustrate both average differences between the two and impact of halo-to-halo scatter on expected substructure detection probabilities.

The format of the paper is as follows. Section 2 details the Illustris simulations, our host sample, and subhalo properties. Section 3 shows our results on substructure mass fractions and subhalo mass functions. Section 4 explores the implications for substructure lensing.

## 2 SIMULATIONS AND METHODS

We make use of the publicly available Illustris simulations (Nelson et al. 2015; Vogelsberger et al. 2014) for this work and adopt their cosmological parameters:  $\Omega_m = 0.2726$ ,  $\Omega_{\Lambda} = 0.7274$ ,  $\Omega_b = 0.0456$ ,  $\sigma_8 = 0.809$ ,  $n_s = 0.963$ , and  $h = 0.704$ . The Illustris suite consists of three hydrodynamic and three dark matter only (DMO) simulations of increasing resolution all initialized at  $z = 127$  in a box that is 106.5 Mpc (co-moving) on a side. We use only the highest resolution version, Illustris-1, which has a dark matter particle mass of  $m_{dm} = 6.3 \times 10^6 M_{\odot}$  and a gas particle mass of  $m_{gas} = 1.3 \times 10^6 M_{\odot}$ . The DMO version of Illustris-1 subsumes the baryonic matter into the dark matter particles and thus has a DM particle mass  $m_{dm} = 7.6 \times 10^6 M_{\odot}$ . In what follows, when we compare dark matter halo masses from Illustris-1 to those in Illustris-1 Dark we account for the excess baryonic mass in the DMO run by multiplying halo masses by  $(1 - f_b)$ , where  $f_b \equiv \Omega_b / \Omega_m = 0.167$ . This approach assumes that the dark matter (sub)halos of interest are effectively depleted of their baryons. For the sake of brevity, we refer to the Illustris-1 and Illustris-1 Dark simulations as simply “Illustris” and “Illustris Dark” below.

## 2.1 Host halo selection

Dark matter halos in the Illustris catalogs were derived using a friends-of-friends (FoF) algorithm with a linking length of 0.2 times the mean inter-particle separation. After these FoF halos were identified, SUBFIND (Springel et al. 2001) was run on them in order to identify substructures around the host halos. For the rest of this work, we rely on two of the halo mass measurements provided in the Illustris data release. The first of these masses is  $M_{200}$ , which is defined as the total mass enclosed in a sphere of radius  $R_{200}$  that has a mean density 200 times the critical density of the universe. The second mass parameter, which we refer to as  $M_{\text{halo}}$ , is the mass that is bound to that halo but not bound to any of its subhalos. In general, we will use  $M_{200}$  when discussing the host halos, and  $M_{\text{halo}}$  when discussing subhalos. We will also refer to halos and subhalos in terms of their  $V_{\text{max}}$ , which is the maximum circular velocity of the halo. In our substructure analysis, we consider every subhalo within  $R_{200}$  of the host and usually consider only subhalos with  $M_{\text{halo}} > 10^9 M_{\odot}$  (with more than 130 particles) in order to ensure completeness.

Our aim is to explore substructure in massive halos of the type associated with strong-lens systems focusing on the distribution of mass fractions, and substructure mass functions. As a benchmark, we refer to the sample used in Vegetti et al. (2014), which has an average redshift of  $\langle z \rangle = 0.233$  and consists of galaxies with stellar masses  $M_{\star} = 10^{11.45 - 11.95} M_{\odot}$ . Motivated by this, we focus our study on galaxy halos in the the  $z = 0.2$  Illustris snapshot that host galaxies in this stellar mass range. We also make sure that the subhalo containing the galaxy is the most massive system in its FoF group, this works as a rough isolation criteria. We then create a matched DMO sample by using matching files provided in the public Illustris data release to match to Illustris Dark. This leaves us with a lens host sample of 122 halos in both Illustris and Illustris Dark. Fig. 1 shows the basic properties of our host galaxy-halo sample, with the dark matter only halo masses corrected by the baryon fraction ( $1-f_b$ ). Interestingly, even after the hosts from Illustris Dark are corrected for the baryon fraction, they still end up being slightly more massive than the matched sample from Illustris. This may be associated with the dynamical loss of dark matter in response to explosive feedback episodes (Taylor et al. 2016).

Our sample of simulated galaxies covers the same stellar mass as the Vegetti et al. (2014) lens sample, with a  $M_{200}$  range of  $5 \times 10^{12}$  to  $4 \times 10^{13} M_{\odot}$ . In terms of  $V_{\text{max}}$ , this translates to halos between 300 and 700  $\text{km s}^{-1}$ . Note that while our sample has been selected from the same stellar mass range as the Vegetti et al. (2014) sample, it has a different distribution. This is because while there are more galaxies at smaller masses, galaxies at larger masses are more likely to be strong lenses. In order to account for this, we weight the distribution of galaxies by  $\sigma^4$ , where  $\sigma$  is the velocity dispersion of halo. This is roughly how lensing strength scales with increasing mass (Bourassa, Kantowski & Norton 1973), and once correcting for this effect, our distribution of stellar masses looks similar to that from the Vegetti et al. (2014) sample. The resulting distribution is shown in Fig. 1. For the rest of this work, we will weigh our samples by the same factor.

## 2.2 Subhalo selection

For the substructure, we restrict ourselves to the Illustris subhalo catalogs and subhalos with a mass  $> 10^9 M_\odot$ . Furthermore, we restrict ourselves to halos within  $R_{200}$  of the host halo. However, It is important to note that small halos along the line of sight to a lens could also cause perturbations and also influence the lensing signal (Metcalf 2005; Despali et al. 2017).

One important issue concerns the definition of subhalo mass. There are at least two separate classes of mass ambiguity important for substructure lensing studies. The first has to do with translating a reported subhalo mass from a lensing analysis to a subhalo mass as measured in a simulation. The second has to do with how one defines subhalo mass in a simulation from the outset. We refer the reader to Minor, Kaplinghat & Li (2016) for a discussion of how the shape of the assumed perturber’s density profile affects strongly the mapping between the mass reported for a subhalo in simulations and the mass usually assumed in lensing models. The second issue is explored in Appendix A, where we show that different halo finders can lead to a factor of  $\sim 2$  differences in subhalo mass functions derived for the same simulation. As we move towards an era where strong lenses suitable for substructure constraints become more common, the community will need to agree upon the best way to characterize subhalos and their masses to make progress in constraining the nature of dark matter or galaxy formation on small scales. In this paper we adopt the subhalo masses as defined in the primary Illustris catalog.

We note that the Illustris catalogs contain a few low-mass items in the subhalos catalogs (about one per host) that are fully baryon-dominated (with more than 50 per cent of the total mass baryonic). These unusual systems are typically found close to the central galaxy (see Appendix B) and are potentially associated with SUBFIND identifying part of the host galaxy as a separate galaxy subhalo. In general, these baryon-dominated halos tend to be star particle dominated at very small radii ( $r < 10$  kpc) and gas dominated further out ( $10 \text{ kpc} < r < 25$  kpc). For the rest of this analysis, we throw out any baryon-dominated subhalos because we are interested only in prospects for detecting actual dark matter substructure. However, it is worth noting that any real clumps of gas or stars (e.g. star clusters, tidal dwarf galaxies, or gas clouds) in the vicinity of lens hosts could be a significant background in lensing searches for dark substructure. Studies of this effect have estimated the contamination to be about 10 per cent although the specifics depend on the lens method, and the mass of the perturber (Hsueh et al. 2017a; Gilman et al. 2017; He et al. 2017).

## 3 RESULTS

The left panel of Fig. 2 shows subhalo mass functions (within  $R_{200}$ ) for our Illustris (magenta) and Illustris Dark (black) host samples. The lines show median values and shaded bands show 68 percentile confidence intervals. Subhalo masses in Illustris Dark have been scaled  $M_{\text{halo}} \rightarrow (1 - f_b)M_{\text{halo}}$  in order to account for the baryonic mass subsumed by the ‘dark matter’ particles in the DMO run. The right panel of Fig. 2 shows the corresponding subhalo  $V_{\text{max}}$  functions (again with  $V_{\text{max}} \rightarrow \sqrt{1 - f_b}V_{\text{max}}$  in the DMO runs). The full physics runs display fewer subhalos in both presentations. The bottom panels quantify the difference by showing the ratio of subhalo counts in the DMO simulations to the

hydrodynamic simulations. The hydrodynamic simulations have about a factor of two fewer subhalos at fixed subhalo mass than the DMO simulations, even after accounting for baryonic mass loss.

In addition to having fewer subhalos at a given mass, the full hydrodynamic simulations appear to have a different shape in the subhalo mass function. Previous work has reported that hydrodynamic simulations and DMO simulations have different slopes (Despali & Vegetti 2016; Chua et al. 2016), but our results suggest a more nuanced difference. Interestingly, the mass functions for the full hydrodynamic run seems to match the DMO simulations at high masses ( $M_{\text{halo}} > 2 \times 10^{10} M_{\odot}$ ) and to have the same slope at low masses. The only real difference in slope is in the intermediate mass regime ( $M_{\text{halo}} \approx 10^{10} M_{\odot}$ ;  $V_{\text{max}} \approx 40$  km/s), indicating a mass range where subhalo destruction may be most efficient, and potentially indicating that fitting halo mass functions with a single slope may not be entirely accurate.

What is the cause of this substructure depletion? As seen in previous work focusing on Milky Way size halos (Brooks & Zolotov 2014; Wetzel et al. 2016; Zhu et al. 2016; Sawala et al. 2016a; Garrison-Kimmel et al. 2017), the origin appears to be subhalo interactions with the central galaxy. Evidence for this is presented in Fig. 3, which shows the average differential number density of subhalos as a function of radius in the DMO (black) and full physics (magenta) samples. Here we include all subhalos more massive than  $M_{\text{halo}} = 10^9 M_{\odot}$ . We see that not only are there fewer subhalos in Illustris compared to Illustris Dark, but the radial distribution is significantly depleted in the central region. There is a sharp cutoff in dark subhalo counts within  $r \approx 20$  kpc, which we attribute to interactions with the central host galaxy. This lack of expected dark subhalos at small radius could potentially be important for sub-structure lensing studies, which are sensitive to subhalos at small projected radius, comparable to the host lens Einstein radius (typically  $\lesssim 10$  kpc). We explore implications for lensing explicitly in the next subsection.

### 3.1 Implications for subhalo lensing

Gravitational lensing studies are sensitive to the projected mass along the line of sight near the lens plane of the host. Substructure constraints are often quoted in terms of the projected mass fraction in substructure (e.g. Dalal & Kochanek 2002; Vegetti et al. 2014) or the projected subhalo mass function (Hezaveh et al. 2016). We explore predictions for both approaches here.

Fig. 4 provides a comparison to the results of Hezaveh et al. (2016), who report projected subhalo counts per unit area based on their lensing analysis. For each host halo in our Illustris and Illustris Dark sample, we construct 100 random projections through the halo and count the number of subhalos  $N$  more massive than  $M_{\text{halo}} = 10^9 M_{\odot}$  within a projected cylinder of radius  $R = 10$  kpc and length  $L = 2 \times R_{200}$  through the halo. For the full hydrodynamics run we include subhalos whether or not they have an obvious stellar component. The fraction of projections that have a given subhalo count per unit area is shown as a histogram on the left and cumulatively on the right, with solid black lines corresponding to the DMO simulation and solid magenta lines corresponding to the hydrodynamical simulation. We see that the vast majority of projections in the Illustris

sample (~95 per cent) include no subhalos above our mass cut within this projected radius. The fraction of empty projections drops only slightly to ~85 per cent in the Illustris Dark sample.

The cyan bands show the reported projected subhalo count from Hezaveh et al. (2016), where the width of the band represents the 95 per cent confidence interval.<sup>1</sup> The Hezaveh et al. (2016) range is noticeably offset from the distribution seen in Illustris, with more substructure than would be expected along a typical projection. Only ~0.25 per cent (~1 per cent) of the projections from Illustris (Illustris Dark) are consistent with the reported counts. One possible reason for this is that a halo is more likely to be a strong lens if it is viewed along its major axis towards the observer. The dashed lines in Fig. 4 shows results if we restrict each halo to be viewed only along its densest axis. With this restriction, the fraction of projections consistent with the Hezaveh et al. (2016) range increases to ~2.5 per cent (7 per cent) and the fraction of empty cylinders drops to ~65 per cent in Illustris and ~72 per cent in Illustris Dark. It is important to note that while the vast majority of our projections through the halo produce no detections, the comparison to the Hezaveh range is not an ideal one given the observational range was based on a single detection, additionally the Hezaveh et al. (2016) system is at a higher redshift  $z = 0.299$ , and thus the system could not have had enough time to destroy a significant amount of substructure. We now turn to the larger comparison set of Vegetti et al. (2014).

Fig. 5 shows a similar analysis to that presented in Fig. 4, now recast for comparison to the substructure mass fraction results reported in the gravitational imaging analysis of 11 systems reported in Vegetti et al. (2014). We use the same procedure as outlined in the comparison to Hezaveh et al. (2016), however now instead of only counting the number of subhalos detected above  $10^9 M_{\odot}$  we explicitly account for their masses, using only the dark matter mass in the full hydrodynamics run. In order to compute the mass fractions in the simulated halos, we include the mass of all subhalos with centers that lie within the cylinder and divide by the mass of all dark matter particles within the cylinder. This means that there are cases where some fraction of the subhalo mass that sits outside the cylinder's radius is included, but the approach is reasonable because the centers of halos are most important in producing lensing anomalies. The line colors and types mirror those in Fig. 4 and the grey shaded region shows the distribution from the Vegetti et al. (2014) sample who measured a mass fraction of  $f = 0.0076^{+0.0208}_{-0.0052}$ . This mass fraction estimate was derived given that they include 11 systems with one detection and a mass fraction for that detection of  $f = 0.0215$  (Vegetti et al. 2010). With this fiducial comparison, we see that the distribution from the Vegetti et al. (2014) is consistent with projections from both Illustris and Illustris Dark within the measured uncertainty. Most of the lensing systems in the Vegetti sample (~90 per cent) include no detected substructure, as expected from the simulations. Of the projections with a detection, a majority are a single subhalo, meaning the scatter in mass fraction is driven mostly by scatter in the subhalo mass itself. Interestingly, the fraction of empty

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<sup>1</sup>Hezaveh et al. report a differential mass function per unit subhalo mass. We have derived the gray band by integrating their mass function to  $10^9 M_{\odot}$ , assuming their reported power law.



projections is predicted to be lower than observed if we restrict ourselves to the densest axis projections.

It is important to note that the non-detections depend on the lowest subhalo mass that can be measured, so as techniques and observations improve, the space below mass fractions of  $\approx 10^{-3}$  will be filled in with detections of smaller halos both in the current sample of lenses that can be measured and in lower mass hosts or less dense projections through the halo with lensing efficiencies that are too weak provide a currently detectable signal. Furthermore, there is some ambiguity in this direct comparison due to the different ways that mass fractions are computed from the data, and in this work. In particular the Vegetti et al. (2014) sample mass fractions are computed taking into account many additional factors in a statistical framework including the slope of the subhalo mass function, and a minimum subhalo mass of  $4 \times 10^6 M_{\odot}$  which is significantly lower than the resolution limit of the Illustris simulations.

There also appears to be mismatch in that the simulations show a tail of very high mass fraction projections. This appears to be partially an artifact of our adding the entire subhalo mass in every subhalo mass fraction estimate in cases where large subhalos sit at the edge of the cylinder. To test this we compute the mass fraction two alternative ways. First, we estimate the total subhalo mass by counting every particle associated with a subhalo that was within the cylinder. This cuts down on adding a significant amount of mass that is outside the cylinder, but with the added problem that often we are counting very low density parts of halos that are outside of the cylinder, which will probably not contribute to the lensing signal. This method reduces the number of non-detections; however, most of these non-detections end up in a tail down to low mass fractions caused by only the outskirts of a halo being within the cylinder, and are most likely not dense enough to cause a detectable lensing perturbation. The second method is similar, but excludes particles from subhalos that do not have centers within the cylinder. With this method, the mass fraction of systems does decrease by about a factor of 2.

The surface density of subhalos (and subhalo mass fractions) that we expect to see along a given projection through a halo is highly sensitive to the projected radius used. This expectation can be seen in Fig. 3, where we have shown that subhalos tend to be evacuated near a halo's center owing to tidal destruction. Though surface counts can include halos with large 3D radius that just happen to project within small radii, the effect is still important. Fig. 6 reproduces the analysis shown in in Fig. 5 but with cylinders of both smaller ( $R = 5$  kpc) and larger (25 kpc) radii. We see that the fraction of projections with zero subhalos increases dramatically for the 5 kpc case and decreases for the 25 kpc cylinder. Typical Einstein ring radii for massive galaxy lenses are  $\sim 5$  kpc (Bolton et al. 2008), so in using  $R = 10$  kpc in the discussion above we are biasing our results towards somewhat higher substructure counts than might be expected in observations. The  $R = 25$  kpc projections clearly result in much higher mass fractions and fewer empty projections than observed, but this is to be expected given the mismatch between  $R$  and typical Einstein ring sizes. Interestingly, the  $R = 5$  kpc distribution from Illustris 1 along the densest axis is in better agreement with the Vegetti et al. sample than was the  $R = 10$  kpc case, as might be expected. However, the limited force and mass resolution of the Illustris simulations subject the 5 kpc

projections to potentially under-predicting substructure at small radius due to over merging. This is why we have used the 10 kpc projections as our fiducial comparisons above.

In summary, given the limited size of the data comparison sample, the predicted substructure fractions seen in both Illustris and Illustris dark appear to be consistent with what has been observed by Vegetti et al. (2014). As sample sizes increase, we would expect observations to more closely align with the predictions of full hydrodynamic simulations if LCDM is indeed the correct underlying model.

### 3.2 Comparison to previous theoretical results

The results of this work appear to be in broad agreement with numerous theoretical results on general subhalo statistics, and more specific analyses relevant for lensing systems. For example, several works have noted the decrease in the subhalo mass function as a result of baryonic processes (Despali & Vegetti 2016; Garrison-Kimmel et al. 2017; Sawala et al. 2016a; Zhu et al. 2016) and in the halo mass function as a whole Chua et al. (2016); Schaller et al. (2015). This decrease seems to be at the factor of two level, and is present in both  $z = 0$  and  $z = 0.2$  mass functions implying that subhalo destruction becomes important at  $z > 0.2$ . In addition, our results are broadly consistent with theoretical results more specifically looking at the comparison between simulations and detections from substructure lensing.

For example, Despali & Vegetti (2016) who used the Illustris and Eagle simulations to compute substructure mass fractions. They measure average mass fractions of  $f_{sub} = 0.0044 \pm 0.0018$  for the DMO simulations,  $f_{sub} = 0.0025 \pm 0.0012$  for the EAGLE simulation, and  $f_{sub} = 0.0012 \pm 0.0004$  for the Illustris simulation. These results are lower than what is measured on average in our analysis, this is potentially due to their framework for estimating the mass fractions which more closely follows the statistical framework used in observational measurements of substructure lensing. This allows them to estimate the contribution of smaller subhalos to the mass fraction than in our analysis, which is limited by the resolution of the simulation. However, due to the large variance between different projections through the halo our results are still broadly consistent. An additional interesting comparison is to results from Jiang & van den Bosch (2017), who used DMO simulations along with a semi-analytic model to measure subhalo mass fractions in halos over a wide range of host halo and subhalo masses. They also find lower mass fractions on average than what is found in our analysis, pointing toward  $f_{sub} \sim 10^{-3}$ . However, the authors note that the halo-to-halo variance is extremely large the results from Vegetti et al. (2014) are within the 90 per cent confidence interval of their simulations.

## 4 CONCLUSION

In this paper, we have used the Illustris simulations (Nelson et al. 2015; Vogelsberger et al. 2014) to investigate the dark substructure content of dark matter halos chosen to be representative of those studied in substructure lensing analyses ( $M_{\text{halo}} = 0.5 - 4 \times 10^{13} M_{\odot}$ ; see Fig. 1) and explored how substructure content changes from the dark-matter-only run of Illustris Dark to the full physics run of Illustris. Our sample consists of more than 100 such host halos at  $z = 0.2$  and we use them to make projections for substructure lensing studies,

specifically for the detection of substructures more massive than  $10^9 M_{\odot}$ , comparable to reported detections (Vegetti et al. 2014; Hezaveh et al. 2016).

We find that the addition of full hydrodynamics reduces the overall subhalo mass function within the virial radius of typical lens host halos by about a factor of two (Fig. 2), an effect that appears to be driven by enhanced central destruction caused by the additional central host galaxy potential (Fig. 3). Naively one would expect this to translate to a factor of two decrease in the expected substructure mass fraction to be observed in lensing studies. However, when viewed in projection to mimic the lensing signal, the large halo-to-halo scatter leads to a more nuanced prediction (Figs 4–6). Specifically, most projections through the halo of size close to an Einstein radius contain no substructure at all. For cylinders of radius  $R = 10$  kpc, the fraction of empty projections rises from ~85 per cent to ~95 per cent as we go from dark matter only simulations to full physics simulations. This large number of expected non-detections implies that in order to constrain CDM or probe the lower limit on galaxy formation by detecting dark subhalos, we may need hundreds of lensing systems as well as predictions that include the effects of central galaxies.

We note that this is not the first time that a difference between dark matter only and baryon physics simulations has been pointed out at the mass scales relevant for subhalo lensing. Despali & Vegetti (2016) used the EAGLE simulation and the Illustris full hydrodynamics run to show a similar offset. This effect appears to continue to the present day with mostly the same offset as shown by Chua et al. (2016). Additionally, several results on the scale of the Milky Way show a similar offset between simulations with and without galaxy formation included (Wetzel et al. 2016; Zhu et al. 2016; Sawala et al. 2016c; Garrison-Kimmel et al. 2017). All of these works see subhalo destruction when comparing baryonic and dark matter only simulations at the factor of two level within the virial radius. The main driver of this effect at the Milky Way scale appears to be an additional tidal field introduced by adding a physical galaxy to the system. Indeed, the effect can be reproduced by simply adding in the potential of a galaxy to a dark matter only simulation (Garrison-Kimmel et al. 2017).

As we move towards an era where we expect many more strong lensing systems suitable for substructure searches, we will need to take into account potential biases in lensing probability. One important potential bias lies within the way that subhalo mass is measured in observations. As discussed in Minor et al. (2016), the profiles used in subhalo lensing analyses could lead to under-estimates in mass. This would potentially increase the measured substructure mass fractions. In addition to this observational bias there are potential biases in the simulations themselves. First, how subhalos are assigned mass by halo finders which can modify subhalo masses by a factor of 2 (see Appendix A for more details). This would similarly raise the mass fractions compared to what is seen in this work. Finally, if lens systems are biased to be viewed along a dense projection, we find that this can reduce the number of non-detections from ~85-95 per cent in the case of random projections to ~60-85 per cent in the case of looking along the most dense axis of a halo (depending on the projected radius). It is important to note that while the number of suitable lenses for substructure explorations is rather small today, we expect the number to explode in the near future owing to large-area, deep surveys such as DES, LSST, and Euclid. Simultaneously, our ability to detect substructure will substantially improve as more studies

are done with ALMA, and in the near future with JWST. We expect the ability of substructure lensing to discriminate between dark matter theories will dramatically increase in the near future from two complementary approaches.

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## APPENDIX A: AMBIGUITY IN SUBHALO MASSES

Halo finders assign masses to subhalos in different ways, and therefore produce different subhalo mass functions even when applied to the same simulations. We illustrate this problem by analyzing our Illustris Dark halo sample using three different halo finders. In addition to the default Illustris halo finder SUBFIND (Springel et al. 2001), we use Rockstar (Behroozi, Wechsler & Wu 2013) and Amiga Halo Finder (AHF; Knollmann & Knebe 2009). Each of these halo finders work in different ways, and we refer the reader to the specific papers for in depth explanations of their differences. We provide a short description of each method below.

Rockstar works by running a 3D FoF algorithm to identify overdensities, and then a 6D phase space algorithm is run to identify halos, the linking length is adaptively tuned so that some fraction (by default 70 per cent) of the particles in that group are linked together with at least one other particle. Seed halos are placed at the bottom of those groups with particles assigned to their closest seed. Finally, unbinding is performed, and then subhalo properties are calculated. In AHF, dark matter structure and substructure is identified via a grid, where the grid is refined iteratively based on the local density. In practice, if there are more particles in a cell than a number which can be set by hand, the cell is divided in half and the process is repeated. Once this procedure is finished, the most dense areas are called the halo centers and particles are assigned to those halo centers. Finally, unbound particles are removed iteratively, with particles moving at some multiple of the escape velocity (by default  $1.5 v_{esc}$ ) removed. In contrast to these, the default Illustris halo finder is SUBFIND. SUBFIND is based on a hierarchical Friends of Friends (FoF) algorithm, where the FoF linking length is reduced in discrete steps. Within the FoF group, a smoothing kernel is used to estimate the density within the group. Any locally overdense area of the FoF group is labeled a “substructure candidate”, and once the algorithm has identified all locally overdense regions, it assigns dark matter particles to those candidates, and undergoes an unbinding procedure eliminating unbound particles. If the remaining candidate has enough particles in it to pass some pre set threshold (32 in Illustris), it is counted as a subhalo.

The subhalo mass functions are shown in the left hand panel of Fig. A1 for Illustris Dark. In general, the fiducial Illustris halo finder (SUBFIND) has the lowest abundance of halos, and Rockstar the highest, with AHF somewhat in the middle, although the halo mass function produced by AHF seems to have a different slope. This disagreement can be due to two competing reasons; either the halo finders are finding different populations of halos, or they are finding the same populations of halos but assigning them different masses. We argue that the significant disagreement can be almost completely attributed to assignment of particles to halos. This can be illustrated by looking the associated  $V_{max}$  function (right panel of Fig. A1). While the agreement is not perfect, it is significantly better than in the halo mass functions and this implies that it is mainly a mass definition issue, and not that the halo finders are identifying different populations of halos. We have additionally run the halo finders on the full hydrodynamics simulations and find similar differences between halo finders. This is particularly interesting as this implies the offset between Illustris and Illustris Dark seen in Fig. 2 is preserved regardless of what halo finder is used.

The differences in the mass assignments can be attributed to different ways in which the halo finders assign bound particles. AHF and SUBFIND use a 3D algorithm with an iterative unbinding criteria. Rockstar calculates the fraction of particles that are bound to the halo, and if it is within some acceptable tolerance (by default 50 per cent bound fraction), the halo is accepted; if not it is thrown out. To test this idea, we can modify the binding criteria of AHF and Rockstar. This is illustrated in Fig. A2. Here we set the AHF binding criteria to reject particles moving faster than  $1.25 v_{esc}$  (where the the default  $1.5 v_{esc}$ ). We have modified Rockstar to reject halos that have more than 95 per cent of their particles unbound (raised from the default 50 per cent). Once this is done, we see much better agreement between the three halo finders.

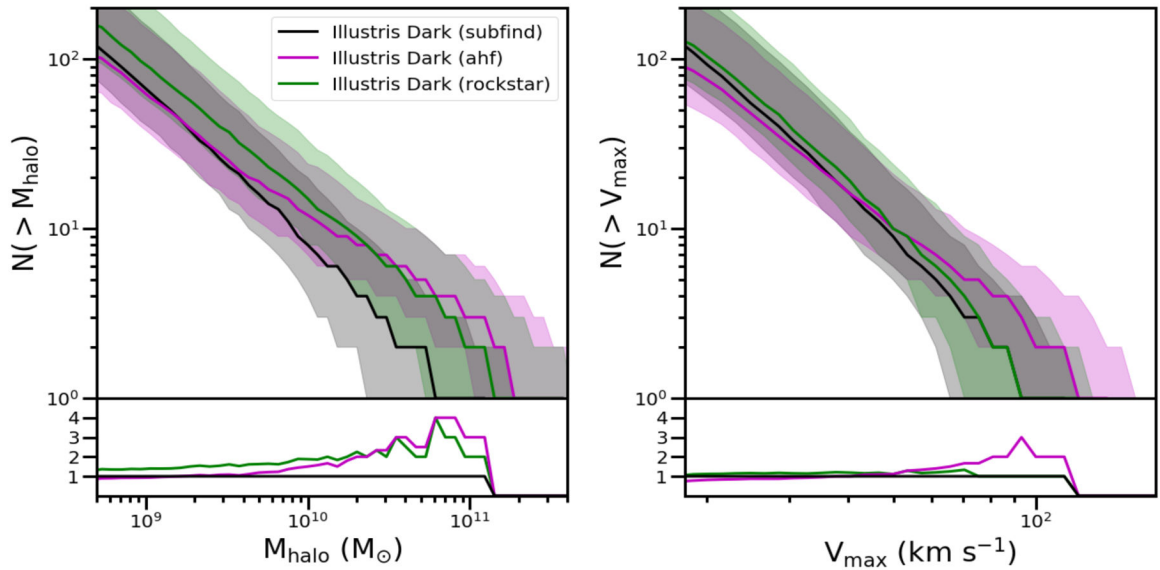
The above exercise illustrates that subhalo mass is a fairly subjective measure and therefore not an ideal choice for direct comparisons subhalo lensing studies. When subhalos are counted using their  $V_{max}$  values, the results are in much better agreement between halo finders. This is because  $V_{max}$  probes the inner regions of the halo, and is therefore less sensitive to bound versus unbound particles. As the field moves towards more precise comparisons,  $V_{max}$ , or similarly the mass within some small radius, will be a robust parameter with which to compare simulations and observations. This is similar to what is advocated by Minor et al. (2016).

For a more thorough analysis of the difficulties involved in halo finding, particularly in defining halo masses, we refer the reader to Knebe et al. (2011), who carried out a much broader comparison of halo finders and echo the sentiment that a parameter such a  $V_{max}$  should be used in place of halo mass. Additionally, we refer the reader to the subhalo comparison project (Onions et al. 2012) who looked at a variety of halo finders and their ability to recover subhalos around Milky Way-like galaxies. Similar to our analysis they find that the halo finders agree in general in identification of subhalo positions, but masses (and therefore mass functions) can vary on the level of 20 per cent.

## APPENDIX B: BARYON DOMINATED SUBSTRUCTURES

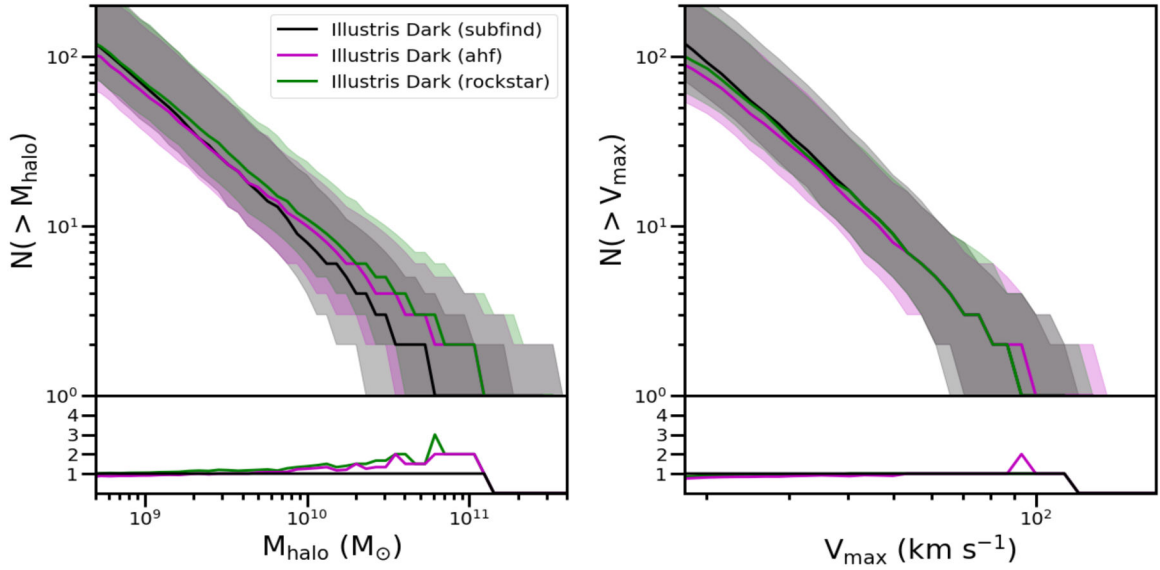
It is possible that baryonic clumps rather than dark matter clumps will be detected in strong lensing searches for substructure. Concern for such a scenario was raised by Gilman et al. (2017) and Hsueh et al. (2017a), who showed that luminous substructures can cause anomalous lensing signals in theory, and potentially confirmed by Hsueh et al. (2017b), who found a flux ratio anomaly from an edge-on disk.

As mentioned in Section 2, there are several baryon-dominated structures listed as subhalos in the Illustris catalogs among our sample of 122 galaxy hosts. Fig. B1 shows the radial distribution of all of the subhalos in our fiducial sample stacked together. The green and red histograms show gas-dominated and star-dominated systems, respectively, while the black histogram shows dark-matter dominated subhalos. There are about 100 baryon-dominated “subhalos” out of  $\sim 10,000$  subhalos in total. Most of them exist within the central  $\sim 20$  kpc of the galaxy. We have chosen to remove these systems from our analysis, which focuses on predictions for *dark* substructure. If the majority of these baryonic substructures are “real” predictions – as apposed to spurious numerical artifacts associated with halo finding in the vicinity the galaxies themselves – they would need to be treated as foregrounds in any dark subhalo search.



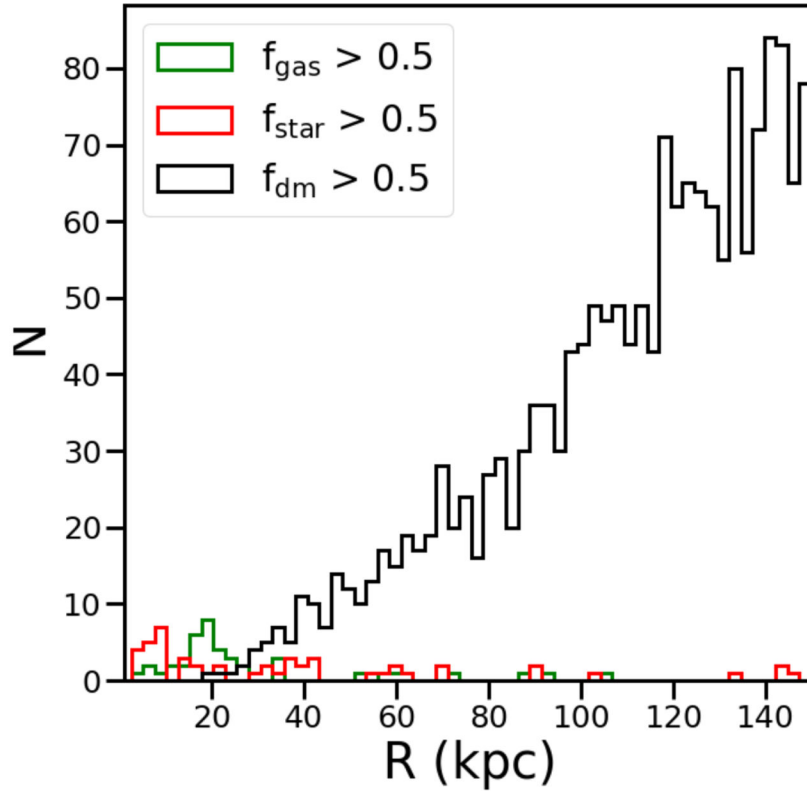
**Figure A1.**

The subhalo mass functions (left) and subhalo  $V_{\text{max}}$  functions (right) for the galaxies in our sample compared between different halo finders (AHF and ROCKSTAR) run with their fiducial parameters.



**Figure A2.**

Same as in figure A1; however, the fiducial parameters for ROCKSTAR and AHF have been modified. First, the velocity at which particles are determined to be unbound in AHF was lowered to  $1.25 v_{\text{esc}}$  (from the default  $1.5 v_{\text{esc}}$ ) and the binding criteria for rejection in Rockstar was modified to 95 per cent (from the default 50 per cent).



**Figure B1.**

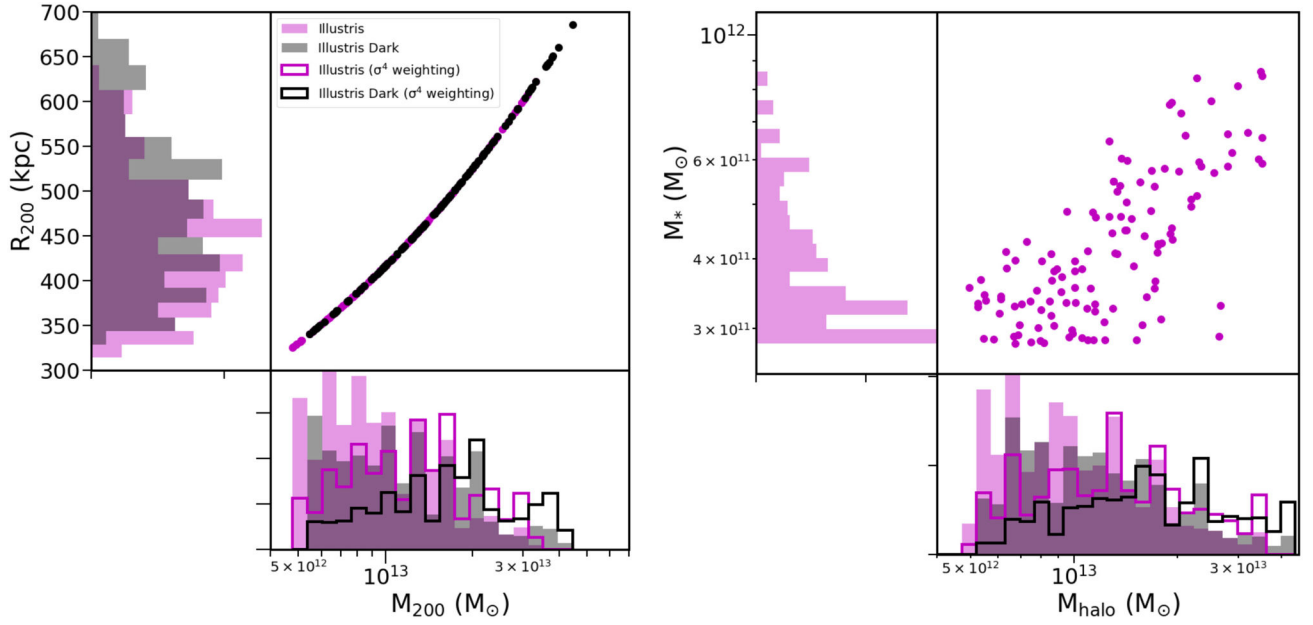
Objects from the SUBFIND subhalo catalog within 150 kpc of all of the systems selected from Illustris above  $10^9 M_{\odot}$  in halo mass. The histograms are colored by the most dominant particle in the object, red if the stellar mass is over 50 per cent the total mass, green if the gas mass is over 50 per cent of the total mass, and black if the halo is dark matter dominated.

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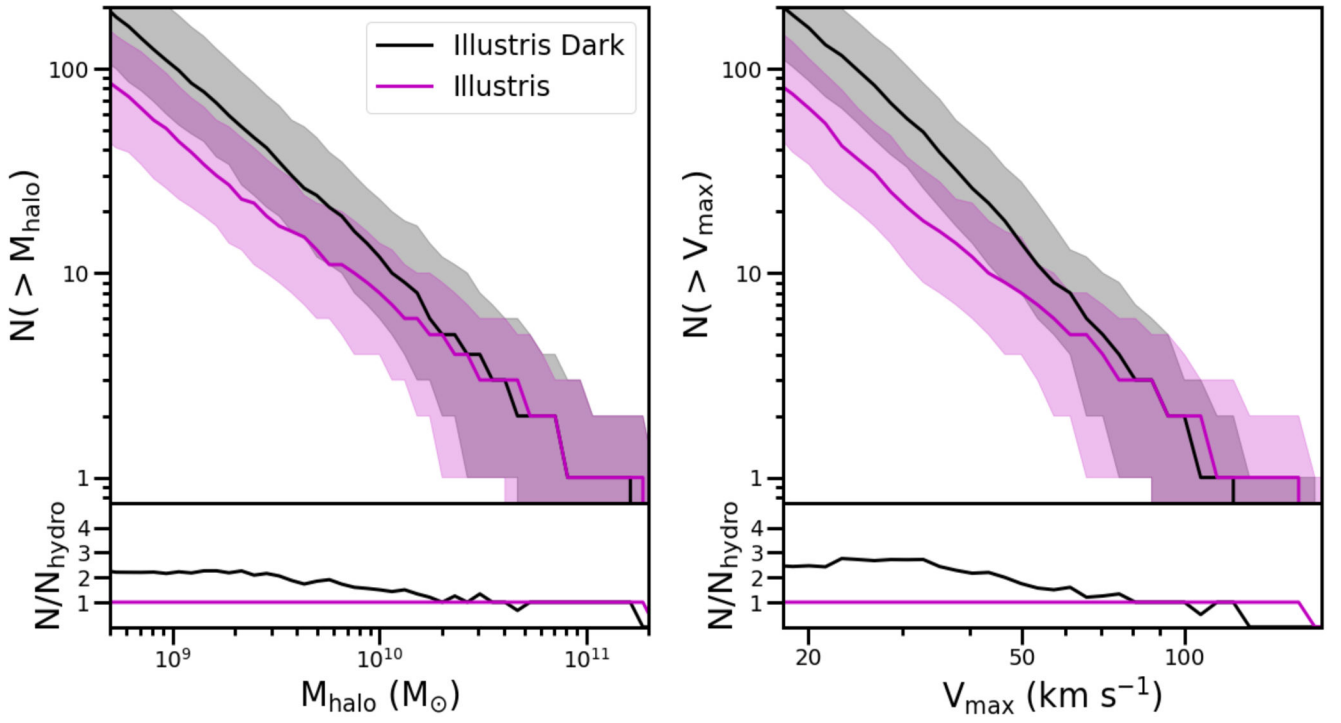


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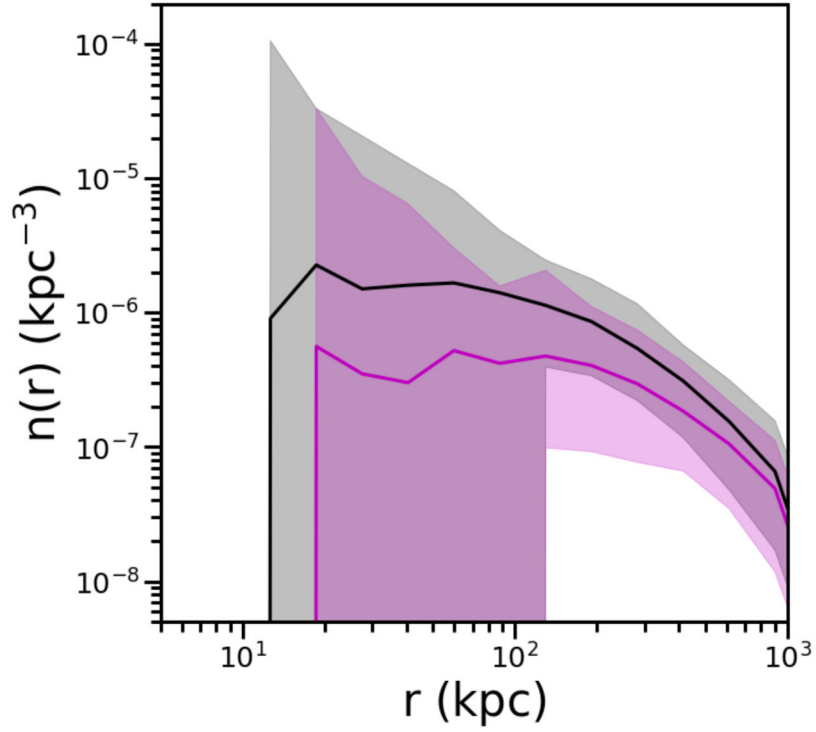


**Figure 1.**

Properties of the host halos of our mock lens sample taken from Illustris and Illustris Dark selected such that they are isolated (as described in text) and that they are identified as the same halo in both Illustris and Illustris Dark. Left:  $M_{200}$  versus  $R_{200}$  for the sample. Right:  $M_{halo}$  versus galaxy stellar mass  $M_{\star}$  (for Illustris). The shaded histograms represent the fiducial sample, and the unfilled histograms represent the results of weighting the systems by  $\sigma^4$ , reflecting the fact that systems for which a multiply lensed galaxy is detected are biased towards larger halos (see Section 2). Note that while  $M_{200}$  and  $M_{halo}$  are similar, they are noticeably different (see Section 2.1 for definitions of these two masses).

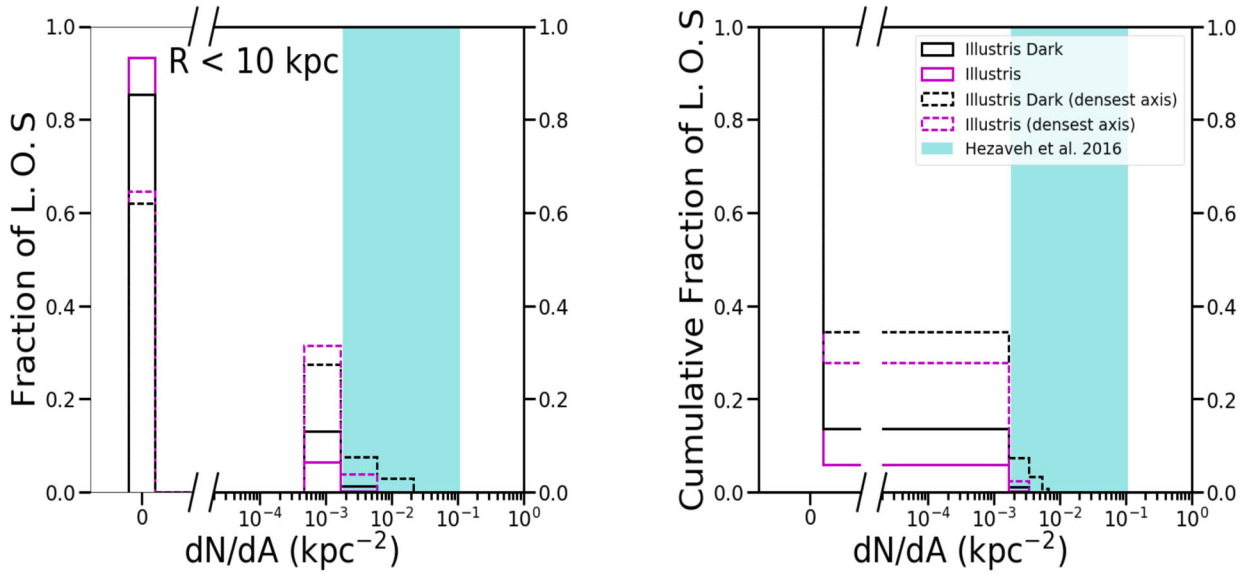


**Figure 2.** Median subhalo mass functions (left) and  $V_{\max}$  functions (right) for our host galaxy samples from Illustris (magenta) and Illustris Dark (black). Lines show medians, with 68 per cent shown as shaded bands. As emphasized in the lower panels, the DMO runs contain roughly twice as many subhalos as the hydrodynamic runs.



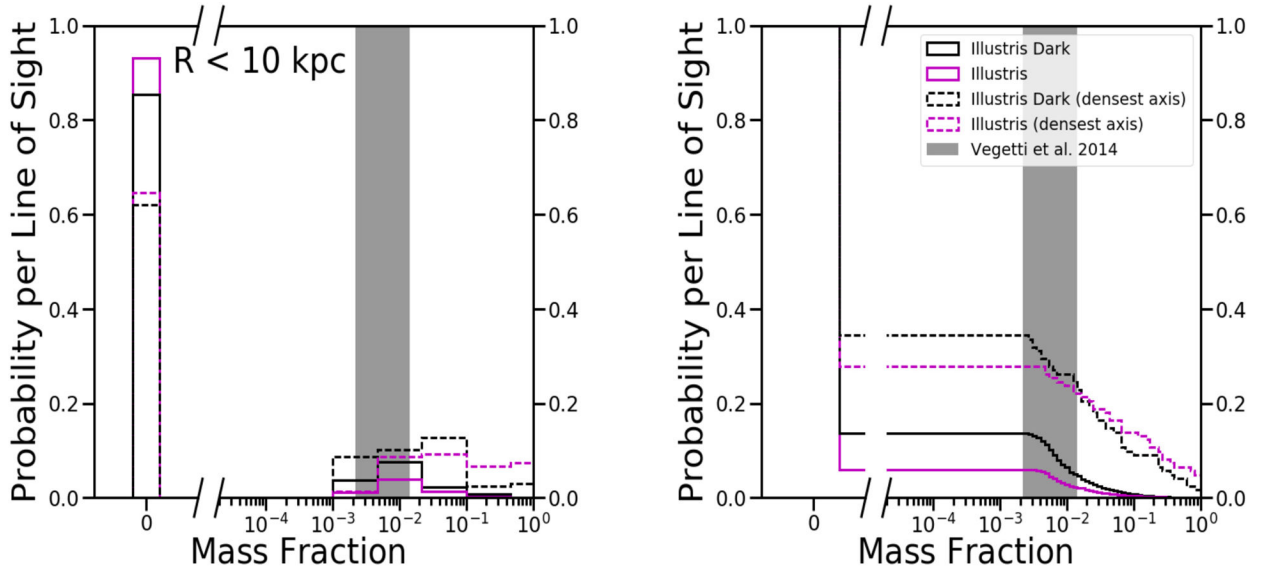
**Figure 3.**

Average 3D radial distributions of dark subhalos more massive than  $M_{\text{halo}} = 1 \times 10^9 M_{\odot}$  in Illustris (magenta) and Illustris Dark (black) as a function of radius  $r$ . Shown are averages over all host halos in our large sample of hosts. Not only is the overall count of subhalos reduced in the hydro runs, but their radial distribution is less centrally concentrated. This strongly suggests that dynamical disruption of substructure from the central host galaxy plays a major role reducing substructure counts compared to the DMO simulation.



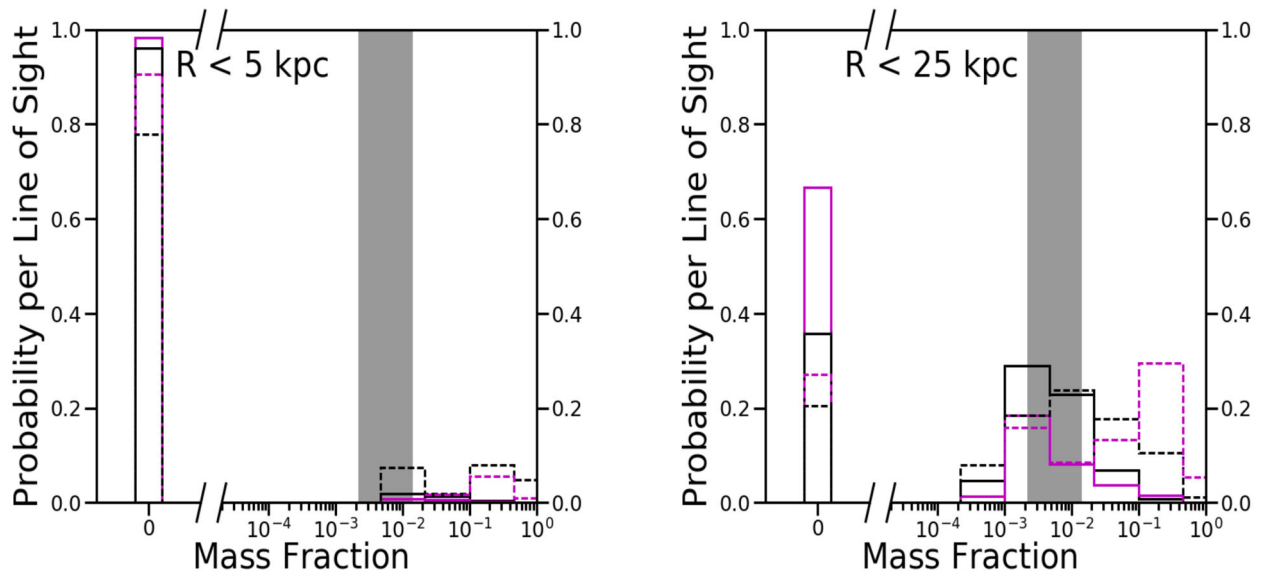
**Figure 4.**

Subhalo surface number density distributions. Left: Fraction of projections through our Illustris (magenta) and Illustris Dark (black) halos that contain a given number of subhalos per unit area. The bin on the far left corresponds to projections with no substructure. We count only subhalos with  $M_{\text{halo}} > 10^9 M_{\odot}$  in cylinders of radius  $R = 10$  kpc, which is typical (though somewhat larger) than an Einstein radius for strong lenses of this type. The solid lines show results when each halo is viewed along 100 random projections through the halo. The dashed lines include one projection per halo, viewed along each host halo's densest axis. Right: the same distributions shown cumulatively. The shaded regions in both panels show the substructure surface density derived from Hezaveh et al. (2016) for the same subhalo mass cut. The simulated halos typically have lower substructure fractions than observed, with many projections containing no subhalos at all. This is especially true for the full physics simulations.



**Figure 5.**

Subhalo mass fraction distributions. Left: Fraction of projections through our Illustris (magenta) and Illustris Dark (black) halos that contain a given mass fraction in substructure within cylinders of radius  $R = 10$  kpc with length  $L = 2 \times R_{200}$ . Right: the same distributions shown cumulatively. We have counted the mass in subhalos  $M_{\text{halo}} > 10^9 M_{\odot}$  whose centers sit within the cylinder. The grey shaded region corresponds to the reported results of Vegetti et al. (2014). The solid lines show results when each halo is viewed along 100 random projections through the halo. The dashed lines include one sightline per halo, viewed along each host halo's densest axis.



**Figure 6.**

The same as figure 5 except varying the assumed projected radius. Predictably, changing the radius to 5 kpc drastically lowers the projections with a detected substructure, while increasing to 25 kpc increases it.