Major Mergers Going Notts: Challenges for Modern Halo Finders

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ABSTRACT

Merging haloes with similar masses (i.e., major mergers) pose significant challenges for halo finders. We compare five halo finding algorithms' (AHF, HBT, ROCKSTAR, SUBFIND, and VELOCIRAPTOR) recovery of halo properties for both isolated and cosmological major mergers. We find that halo positions and velocities are often robust, but mass biases exist for every technique. The algorithms also show strong disagreement in the prevalence and duration of major mergers, especially at high redshifts (z > 1). This raises significant uncertainties for theoretical models that require major mergers for, e.g., galaxy morphology changes, size changes, or black hole growth, as well as for finding Bullet Cluster analogues. All finders not using temporal information also show host halo and subhalo relationship swaps over successive timesteps, requiring careful merger tree construction to avoid problematic mass accretion histories. We suggest that future algorithms should combine phase-space and temporal information to avoid the issues presented.

Key words: methods:numerical - dark matter - galaxies: haloes

1 INTRODUCTION

In the Lambda Cold Dark Matter paradigm, nonlinear gravitational collapse of matter overdensities yields self-bound structures known as "haloes." Smaller haloes merge onto larger ones continuously, and are called "subhaloes" as long as they remain distinguishable within the radius of the larger halo. Major mergers – i.e., mergers between two haloes of similar mass – occur rarely. Estimates from recent simulations suggest that haloes at z = 0 experience (on average) one merger per halo per 10 Gyrs (Fakhouri & Ma 2008; Wetzel, Cohn & White 2009; Behroozi, Wechsler & Conroy 2013b).

Despite their infrequency, major mergers have been invoked to explain a surprisingly broad range of galaxy phenomena. Galaxy growth correlates tightly with halo growth (see Leauthaud et al.

2012b; Wang et al. 2013; Behroozi, Wechsler & Conroy 2013a,b; Moster, Naab & White 2013; Behroozi & Silk 2015, for recent constraints), so the significant disturbance to haloes in major mergers could also imply significant changes in observable galaxy properties. Merger-linked phenomena with significant recent interest include active galactic nuclei (AGN) activity (Kocevski et al. 2012; Newton & Kay 2013) and associated black hole growth (Treister et al. 2012; Bonoli, Mayer & Callegari 2014), Ultra-Luminous InfraRed Galaxy (ULIRG) triggering (Kartaltepe et al. 2010; Draper & Ballantyne 2012), galaxy morphology and size changes (Bernardi et al. 2011; Prieto et al. 2013), galaxy number density changes (Lotz et al. 2011; Behroozi et al. 2013a), velocity dispersion evolution (Oser et al. 2012), star formation quenching/triggering (Kaviraj et al. 2013; Behroozi et al. 2015), galactic winds (Hopkins et al. 2013; Rupke & Veilleux 2013), buildup of intracluster light (Laporte et al. 2013), buildup of spheroidal bulges (Sales et al. 2012; Wilman et al. 2013), dispersal of magnetic fields

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(Xu et al. 2010), and creation of tidal shells (Wang et al. 2012). They also represent an important systematic for cluster analysis, including violations of hydrostatic equilibrium for X-ray masses (Akahori & Yoshikawa 2010; Takizawa, Nagino & Matsushita 2010; Bourdin et al. 2011; Nelson et al. 2012), biases in Sunyaev-Zel'dovich signals (Rudd & Nagai 2009; AMI Consortium et al. 2011; Krause et al. 2012), and incidence of Bullet Cluster-like systems (Thompson, Davé & Nagamine 2014; Bouillot et al. 2015).

Predicting how major mergers will impact observables often involves a dark matter or hydrodynamical simulation (see Kuhlen, Vogelsberger & Angulo 2012, for a review), a halo finder to convert the simulation particle data into a list of haloes and their properties (see Knebe et al. 2011, 2013b, for reviews), a merger tree algorithm to connect haloes across redshifts (see Srisawat et al. 2013, for a review), and optionally a theoretical model for galaxy formation (see Somerville & Davé 2014, for a review). The role of the halo finder in this process has been investigated in a recent series of workshops (including "Haloes Going MAD," "Subhaloes Going Notts," and "Sussing Merger Trees") and papers (Knebe et al. 2011; Onions et al. 2012; Elahi et al. 2013; Onions et al. 2013; Pujol et al. 2014; Knebe et al. 2013a,b; Srisawat et al. 2013; Avila et al. 2014; Lee et al. 2014; Hoffmann et al. 2014). This paper, arising out of the "Subhaloes Going Notts" and "Sussing Merger Trees" workshops, continues this pattern with an investigation into how halo finders treat major mergers.

Halo finder recovery of very minor subhaloes (mass ratios <1:10) has already been investigated (Muldrew, Pearce & Power 2011; Knebe et al. 2011, 2013b; Onions et al. 2012). Finders which use particle positions alone to initially classify subhaloes are able to perform just as well as finders which use additional information (e.g., particle velocities or historical positions) in the outer halo, as long as gravitational unbinding is performed (Onions et al. 2012; Knebe et al. 2013b). As the larger "host" halo has a much larger velocity dispersion than the smaller subhalo, particle binding energies can very effectively distinguish between particles belonging to the host halo and to the subhalo. In major mergers (mass ratios greater than 1:3), the host and the subhalo have similar velocity dispersions, making particle assignment much harder. Additionally, the choice of which halo to call the "host halo" and which to call the "subhalo" can be ambiguous for major mergers, and can change over time unless temporal information is used (Tweed et al. 2009; Han et al. 2012; Behroozi, Wechsler & Wu 2013; Srisawat et al. 2013). Hence, we investigate halo finders' abilities not only to recover halo properties in major mergers but also to follow halo properties smoothly across simulation timesteps.

We divide the results into several sections. In §2, we briefly describe the participating halo finders. We describe "static" tests of halo finding, with overlapping mock Navarro, Frenk & White (1997) (NFW) profiles, in §3. "Dynamical" tests are presented in §4, where two mock NFW profiles are allowed to merge in an isolated simulation. We present tests drawn from cosmological simulations in §5. Finally, we discuss the impact of these results in §6 and summarize our conclusions in §7. Throughout this work, halo masses are calculated as spherical overdensities, and host halo masses include all substructure masses.

2 COMMON TERMS AND HALO FINDER DESCRIPTIONS

In this section, we define common terms and briefly describe the participating halo finders (AHF, HBT, ROCKSTAR, SUBFIND, and VELOCIRAPTOR). These descriptions include the overall algorithm employed and particle information used (e.g., positions, velocities, halo membership at previous snapshots), the method for assigning particles in major mergers, and the method for deciding which of two overlapping haloes is the host halo in major mergers. Names following the halo finders are the co-authors who ran the halo finders for this study and provided the following descriptions, who are not always the same as the original halo finder authors.

2.1 Common Terms

Throughout this paper, $\rho_c = 3H^2/(8\pi G)$ refers to the critical density. We use R_{YYYc} to indicate the radius from a halo centre within which the average enclosed density is $YYY \times \rho_c$ (including substructure). Similarly, M_{YYYc} refers to the total mass enclosed within R_{YYYc} . Some halo finders also use R_{vir} , corresponding to an average enclosed density ρ_{vir} as defined in Bryan & Norman (1998). The term " v_{max} " refers to the maximum circular velocity; i.e., the maximum value of $\sqrt{GM(\langle R \rangle/R}$ over a halo's radial mass profile. Finally, "position-space" information refers to particle positions, "velocity-space" information refers to both particle positions and velocities, and "temporal" information refers to the evolution of particles' halo memberships over time.

2.2 AHF (Knebe)

The halo finder AHF¹ (AMIGA Halo Finder, Knollmann & Knebe 2009), is an improvement of the MHF halo finder (Gill, Knebe & Gibson 2004), which employs a recursively refined grid to locate local overdensities in the density field. The identified density peaks are then treated as centres of prospective haloes. The resulting grid hierarchy is further utilized to generate a halo tree readily containing the information which halo is a (prospective) host and subhalo, respectively. Halo properties are calculated based on the list of particles asserted to be gravitationally bound to the respective density peak. To generate this list of particles we employ an iterative procedure starting from an initial guess of particles. This initial guess is based upon the distance of each prospective centre to its nearest more massive (sub-)halo where all particles within a sphere of radius half this distance are considered prospective (sub-)halo constituents. This tentative particle list is then used in an iterative procedure to remove unbound particles and the final particle list is truncated at some user pre-defined overdensity criterion.

The tree for each halo consists of one trunk and several branches where the trunk is the continuation of the main host halo and the branches represent the subhaloes (see Fig. 1 in Knollmann & Knebe 2009). While there are various options in AHF to pick the trunk, the default mode (also applied here) is to recursively follow the branch containing the most particles. This choice certainly leaves its imprint during major merger events studied here.

¹ AHF is freely available from http://www.popia.ft.uam.es/AMIGA

2.3 HBT (Han)

HBT (Hierarchical Bound-Tracing algorithm; Han et al. 2012) is a tracking (sub)halo finder. Isolated haloes are first identified with a standard Friends-of-Friends (FoF) algorithm (Davis et al. 1985). Within each isolated halo, the self-bound part is defined as a central subhalo. Starting from the highest redshift, subhaloes are then tracked down to later snapshots to link to their descendent haloes, by finding host haloes for the progenitor particles. When two or more subhaloes are linked to a common descendent halo, we compare the current self-bound mass of the progenitor subhaloes, and define their self-bound remnants, except the most massive remnant, as satellite subhaloes. The current central subhalo is re-defined to be the self-bound part out of all the particles in the host excluding satellite particles, while its progenitor is defined as the one that produced the most massive remnant. The tracking process is then continued for all the subhaloes including central and satellites down to the final output of the simulation. The position and velocity for HBT subhaloes are defined using the 25% of particles with the lowest local potential energy.

2.4 ROCKSTAR (Behroozi & Mao)

The ROCKSTAR halo finder² (Behroozi, Wechsler & Wu 2013) adaptively shrinks phase-space isodensity contours to identify peaks in phase-space density. Particles within an isodensity contour that contains only one peak are grouped into a single halo (or subhalo); the halo's position and velocity are average values for particles near the phase-space peak (typically, within $0.1R_{vir}$). When an isodensity contour contains multiple peaks, particles are assigned to the closest halo in phase space, determined by the metric d(h, p):

$$d(h,p) = \left(\frac{|\vec{x}_h - \vec{x}_p|^2}{r_{\rm dyn,vir}^2} + \frac{|\vec{v}_h - \vec{v}_p|^2}{\sigma_v^2}\right)^{1/2}$$
(1)

$$r_{\rm dyn,vir} = v_{\rm max} t_{\rm dyn,vir} = \frac{v_{\rm max}}{\sqrt{\frac{4}{3}\pi G\rho_{vir}}}$$
(2)

where *h* is the halo, *p* is the particle, σ_v is the halo's current velocity dispersion, v_{max} is its current maximum circular velocity, and ρ_{vir} is the virial overdensity from Bryan & Norman (1998). Because particles are assigned to haloes before the final masses of the haloes are known, using v_{max} and σ_v (which are both consistently measured even deep inside the halo potential well) improves particle assignment stability. When two haloes overlap, the halo with the larger number of assigned particles is generally assumed to be the host halo. However, in cases where two haloes are within a factor of 0.6 in v_{max} , information on which halo was the host halo at the previous timestep is used to determine which halo will be labelled the host halo at the current timestep.

2.5 SUBFIND (Muldrew & Srisawat)

SUBFIND (Springel et al. 2001) identifies gravitationally bound, locally overdense regions in a halo. Initially, a FoF finder with linking length *b* is used to identify haloes to be processed by SUBFIND. The density of the particles within these haloes is then estimated in an SPH-like (Smoothed Particle Hydrodynamics) fashion using an adaptive kernel interpolation with N_{dens} neighbours within the full volume. Locally overdense regions are identified by considering each particle in order of density and searching for saddle points using the Nngb nearest neighbours. Particles with a higher density than their neighbours are used to define new candidate subhaloes. Particles with neighbours that are of higher density, and are attached to a single substructure, become members of that substructure. Finally, particles with denser neighbours that are attached to two different substructures are considered saddle points. These candidate subhaloes are then iteratively tested for self-boundedness. Starting with the lowest-density saddle point, a hierarchy of substructure is determined. Subhaloes are defined as self-bound structures enclosed within an isodensity contour passing through the saddle point and containing a minimum of Nngb particles. Particles that are not assigned to any substructure are added to the 'background halo.' This is the largest subhalo that was found in the FoF halo, which is also tested for self-boundedness. For this study we used the parameters b = 0.2 and $N_{\text{dens}} = N_{\text{ngb}} = 20$. A more detailed description of SUBFIND can be found in §4.2 of Springel et al. (2001).

2.6 VELOCIRAPTOR (Elahi)

VELOCIRAPTOR³ (Elahi, Thacker & Widrow 2011, a.k.a. STRUCTURE FINDER or STF) is a (sub)halo finder that identifies objects in a two-step process. First, haloes are identified using a FoF algorithm, where candidate haloes identified by a 3DFoF algorithm are pruned of any artificial particle bridges using a 6DFoF and the velocity dispersion of the FoF group. The 6DFoF is also used to flag major mergers, that is the presence of two (or more) large phase-space dense cores in the FoF halo. Here we follow the normal convention and treat the smaller object(s) as a subhalo and the larger as a host halo. These field objects are then searched for substructures by identifying particles that appear to be dynamically distinct from the mean halo background, i.e., particles which have a local velocity distribution that differs significantly from the averaged background halo. These dynamically distinct particles are linked with a phase-space FoF algorithm into substructures. Since this approach is capable of not only finding subhaloes, but the unbound tidal debris surrounding them as well as tidal streams from completely disrupted subhaloes, for this analysis we also ensure that a group is self-bound.

In similar-mass mergers, the mean field is an equal combination of both haloes, thus neither core will contain (many) particles that appear locally dynamically distinct. Hence once the cores overlap enough in phase-space, the system will no longer be flagged as a merger and *the smaller core will not necessarily appear as a dynamically distinct substructure either*.

3 STATIC MOCK PROFILE TESTS

Because no common definition exists for the correct properties of cosmologically-simulated haloes (Knebe et al. 2013b), synthetically-generated haloes are one of the few ways to test halo finder accuracy. We adopt the spherical mock host halo NFW profile described and tested in Muldrew, Pearce & Power (2011), which has a mass⁴ of $M_{200c} = 1.04 \times 10^{14} M_{\odot}$ (other parameters include $R_{200c} = 944.0$ kpc, $R_s = 259.6$ kpc, $v_{max} = 715$ km s⁻¹).

² https://bitbucket.org/gfcstanford/rockstar

³ https://bitbucket.org/pelahi/velociraptor-stf/

⁴ In this case, the critical density is calculated for a flat Λ CDM cosmology with $\Omega_M = 0.3$, h = 0.73, at z = 0.

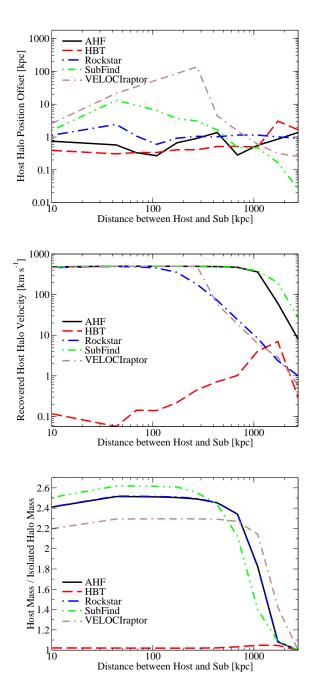


Figure 1. Tests with overlapping identical mock halo profiles (§3) with a 1000 km s⁻¹ velocity offset, as a function of the distance between the halo centres. In these tests, the "host halo" is taken to be the larger of the two returned haloes from each halo finder. **Top** panel: offset between the input and recovered position of the host halo profile. **Middle** panel: recovered host halo velocity; note that most of the halo finders here include substructure when calculating the host velocity. The average velocity of all particles when the two halo profiles overlap completely is 500 km s⁻¹. **Bottom** panel: Recovered host halo mass compared to the recovered halo mass for the largest separation of the two mock haloes ("Isolated halo mass").

The halo profile extends to 2.75 R_{200c} and is sampled with ~ 1.5 million particles, each of mass $1.37 \times 10^8 M_{\odot}$.

We place this halo in the centre of an empty volume and place a duplicate copy of the halo with a velocity offset of 1000 km s⁻¹ and a distance offset between 0 and 2700 kpc. The chosen velocity offset is typical for cosmological major mergers on first infall (Behroozi et al. 2013b); as the haloes' velocity dispersions are both $\sigma_v = 754$ km s⁻¹, this places their centres at an offset of $1.33\sigma_v$ in velocity space. Since the profiles are identical, there is no "correct" host halo or subhalo choice; however, halo finders typically tag overlapping/merging haloes as "host" and "subhalo," respectively. Note that this choice might be arbitrary, but we also decided to follow this notion by referring to the **larger** of the two recovered objects as the "**host halo**" and the **smaller** as the "**subhalo**." Properties for this "host halo" are therefore calculated on the combined profiles, whereas properties of the "subhalo" are (ideally) calculated on particles from only one of the individual profiles.

We show results for recovery of the centre, velocity, and mass for the host halo in Fig. 1. The upper-most panel compares the input position to the one returned for the halo tagged as "host" by the respective finder. The positional offset is typically always smaller than 10 kpc. However, VELOCIRAPTOR calculates halo centres as the centre-of-mass of the innermost 10% of particles within the halo radius (determined iteratively), which leads to larger offsets when the two mock profiles are within 300 kpc. Some differences are also notable in the velocity calculations - as presented in the middle panel. AHF and SUBFIND report averaged particle velocities within the full host halo radius, including particles from the subhalo. However, ROCKSTAR uses a velocity measured closer to the halo centre (at 0.1 $R_{\rm vir}$) and therefore averages fewer particles from the subhalo when determining the host halo's velocity, until the subhalo approaches much closer to the host halo's centre. VELOCIRAPTOR similarly attempts to exclude most substructure when calculating host halo velocities. HBT does not include substructure at all when calculating the host halo velocity, and so the recovered velocity is relatively independent of the subhalo's position. The same explanation holds for HBT in the bottom panel, where the recovered mass is compared against the input host mass. We note that for HBT, which requires a sequence of snapshots in order to recover subhaloes, the haloes were processed (and particles tracked) in order of largest (2700 kpc) to smallest (0 kpc) distance separations.

Fig. 2 shows recovery of the position, velocity, and mass of the subhalo, as well as the fraction of contamination from the host halo's particles. As above, comparison is made to the input positions and velocities of the halo profile closest to the halo finder's recovered subhalo centre. Extremely good agreement (within ~ 1 kpc) is seen for position recovery, and the velocity recovery is generally within 10% of the relative host and subhalo velocities. Notably, no advantage in accuracy is seen for phase-space algorithms. When the haloes are highly overlapping, particle membership is determined largely by a velocity cut; yet, since the halo velocity distributions also overlap, this results in an asymmetric truncation of the subhalo's velocity distribution. Without a special averaging technique, this leads to a systematic positive radial velocity bias. The situation is exactly reversed for the position-space algorithms: particles within a given radial aperture of the subhalo centre will be contaminated with host particles, leading to a systematic negative radial velocity bias. That said, this effect is small in magnitude even for the worst-case scenario shown here. Naturally, the effect does not exist at all for HBT, as particle contamination from the host is not an issue.

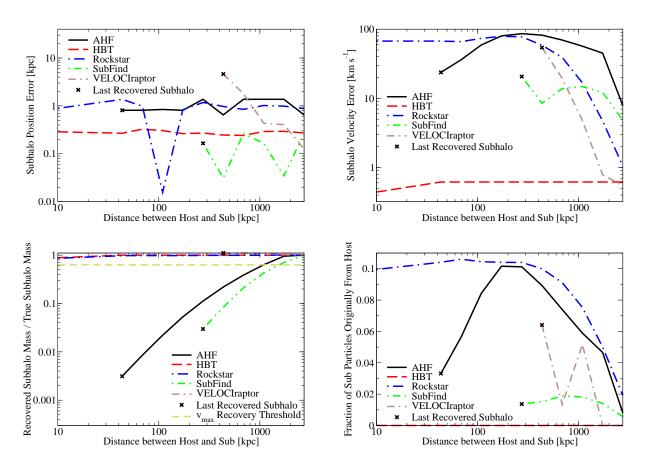


Figure 2. Tests of overlapping identical mock halo profiles (§3) as a function of the distance between the halo centres. In these tests, the "subhalo" is taken to be the smaller of the two returned haloes from each halo finder. **Top-left** panel: errors in recovering the subhalo's position. **Top-right** panel: errors in recovering the subhalo's velocity. **Bottom-left** panel: ratio of the recovered subhalo mass to the input subhalo mass. The *amber dashed line* shows the mass threshold below which it is impossible to recover the true v_{max} of the halo (see §3); see, however, Fig. 3. **Bottom-right** panel: fractional number of particles assigned to the subhalo which were originally from the input host halo's profile.

In terms of mass recovery, the position-space finders are at a severe disadvantage. Ordinarily, position-space finders can collect particles at large radii around substructure density peaks and take advantage of the fact that the high-velocity particles belonging to the host halo will be removed in the gravitational unbinding stage. In effect, this performs a quasi-phase-space particle selection. However, since the velocity dispersion of the two test profiles is the same, this technique no longer works. The positionspace finders therefore end up truncating the mass profile of the subhalo as soon as the profiles begin to overlap (Fig. 2). v_{max} recovery tends to be much better: given an NFW profile which has been spherically truncated, v_{max} is very insensitive to the amount of truncation, as shown in Fig. 3. Yet, v_{max} recovery is impossible if the halo itself cannot be found, which happens below 300 kpc for SUBFIND and 45 kpc for AHF. These problems for position-space finders are also seen, albeit to a lesser extent, for minor mergers (Muldrew, Pearce & Power 2011; Knebe et al. 2011). The phasespace finders do very well by comparison, with ROCKSTAR and VELOCIRAPTOR recovering between 90-95% of the original halo mass. When two haloes overlap significantly in phase space, VE-LOCIRAPTOR treats them as a single halo; however, ROCKSTAR continues to recover two haloes as long as the haloes' innermost density peaks are distinguishable. While both VELOCIRAPTOR and ROCKSTAR are phase-space algorithms, this difference allows ROCKSTAR to recover properties of haloes in major mergers at much closer separations. As expected, HBT is able to perfectly recover the input halo's mass.

Finally, we address the issue of subhalo purity (lower right panel of Fig. 2). ROCKSTAR's subhalo is contaminated at up to the 10% level by particles from the host halo, which is in agreement with the expected fraction of host particles which are $1.33\sigma_v$ offset from the host halo's central velocity. For AHF and SUBFIND, the level of contamination depends on how aggressively they try to recover the subhalo's radial profile. SUBFIND is more conservative (and purer), with the result that it recovers much less mass as compared to AHF. By definition, HBT does not have any purity issues; particles initially assigned to the host are never allowed to be assigned to the subhalo.

4 DYNAMIC MOCK INFALL TESTS

We next consider a more realistic, dynamically simulated test. The initial conditions are two identical mock haloes (the same as described in \S 3) placed at an initial separation of 2700 kpc. We consider two initial velocities for the haloes. In the "Freefall" test, the

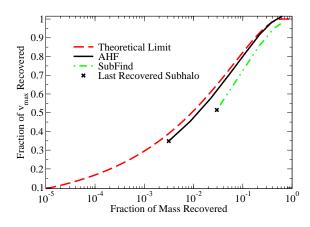


Figure 3. A comparison of fractional mass loss to fractional v_{max} loss in the recovered mock subhalo properties, compared to the theoretical expectation from the NFW profile used.

haloes are released from rest. In the more cosmologically realistic "Dynamic" test, the first halo begins at rest, and the second halo is given a 1000 km s⁻¹ velocity offset, aimed toward a point offset 140 kpc from the centre of the first halo. These initial conditions (taken to occur at a = 1) were simulated forward in time to a = 1.2by PKDGRAV2 (Stadel et al. 2009), including background cosmological expansion according to a flat, ACDM cosmology with $\Omega_M = 0.3$ and h = 0.73 at z = 0; the assumed force resolution was 6.8 kpc. Because an analytic solution for the merger of two haloes is not known, the main purpose of this test was to check the consistency over time of the returned halo properties.

The positions and radii (with masses being proportional to the third power of the radii) of haloes in both tests are shown as a time-series plot in Fig. 4. As in the static tests, the positionspace halo finders show marked artificial mass loss as the haloes approach each other. In addition, these finders show a dramatic "flipflopping" between which halo is assigned to be the host halo and which is assigned to be the subhalo. To be fair, the extreme symmetry of the tests means that all halo finders which do not include some temporal information in deciding host and subhalo relationships will show similar behaviour. However, this behaviour is also seen in cosmological simulations (§5; see also Tweed et al. 2009; Han et al. 2012; Behroozi, Wechsler & Wu 2013; Behroozi et al. 2013b; Srisawat et al. 2013). Since ROCKSTAR includes temporal information for host-subhalo assignments, it does not show flipflopping; similarly, HBT is immune.

One other feature is evident in the "Freefall" test. In ROCK-STAR's results, the subhalo appears to first grow (a < 1.155) and then to lose mass again (a > 1.155). This arises because the cores of the merging haloes reach the centre of the potential well and begin to orbit rapidly, whereas the remainder of the material has a much slower orbital period. When the subhalo core is in-phase with the velocity of the outer remnants, the recovered mass increases; when the subhalo core is out-of-phase, the remnant is assigned to the host halo (Behroozi, Wechsler & Wu 2013). This results in a periodic oscillation of the recovered halo masses, which is a fundamental limit of the phase-space algorithm employed. This problem is avoided in VELOCIRAPTOR because it no longer separates haloes once they begin to overlap significantly in phase space.

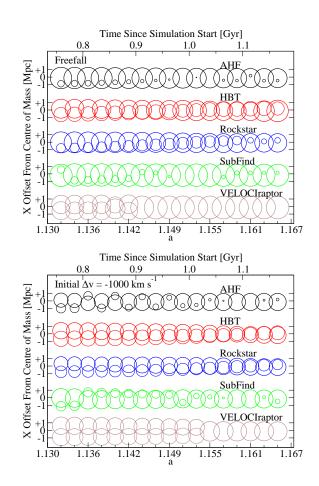


Figure 4. Time series plots for dynamically simulated twin mock haloes; the haloes were released from rest at a separation of 2700 kpc in the **top** panel, and given a more realistic initial velocity offset of 1000 km s⁻¹ in the **bottom** panel (see §4). Each circle corresponds to a halo at the given snapshot; circle radii correspond to the halo radius—i.e., they are proportional to the cube root of the halo mass—and the **bold** circle corresponds to the host halo. The snapshots are equally spaced in scale factor from a = 1.132 to a = 1.165, about 420 Myr, and cover a close interaction between the two haloes (a = 1.15 and a = 1.16 for the freefall and velocity offset cases, respectively). Each tick mark on the bottom axis corresponds to a separate snapshot. Results from each halo finder have been spatially offset for clarity.

5 COSMOLOGICAL TESTS

5.1 Simulation

We make use of a simulation described in Srisawat et al. (2013) and used for several studies emerging out of the Sussing Merger Trees comparison project. This simulation used the GADGET-3 code (an improved version of the code presented in Springel 2005) to simulate 270³ particles (mass resolution: $1.32 \times 10^9 M_{\odot}$) in a periodic box with side length 88.8 Mpc. The adopted initial conditions were taken from the WMAP-7+BAO+H₀ best-fit (Komatsu et al. 2011); i.e., a flat, Λ CDM cosmology with parameters $\Omega_m = 0.272$, $\Omega_b = 0.0455$, h = 0.704, $n_s = 0.967$, and $\sigma_8 = 0.810$. All the halo finders in this project analyzed this simulation as part of Avila et al. (2014).

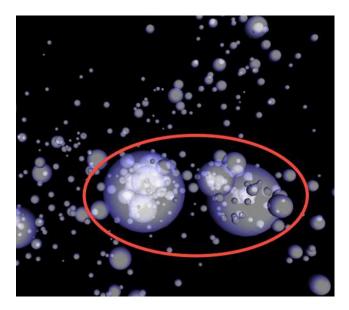


Figure 5. A snapshot of the cosmological simulation described in §5, showing the major merger we have selected for analysis (*red ellipse*). The spheres in this image correspond to the locations and radii (R_{200c}) of haloes returned by the ROCKSTAR halo finder. Full movies of the merger process for all halo finders are available online.⁶

5.2 Individual Test Case

We first examine a test case with an individual major merger, selected from the history of the second largest halo in the box at z = 0.5 A snapshot of the merger (mass ratio = 1:1.8) is shown in Fig. 5, and movies of the halo catalogues returned by all finders are available online.⁶ The returned haloes, pruned to exclude all but the host halo and the merging halo, are shown in the top panel of Fig. 6. The results of §3 and §4 are instructive, as many of the same findings apply. As in those sections, the position-space halo finders struggle to recover the masses of the subhalo, and show clear exchanges of host and subhalo relationships (e.g., AHF at a = 0.78, and SUBFIND at a = 0.76). Additionally, ROCKSTAR shows substantial variation in the subhalo mass when it passes close to the centre; due to the coarser time resolution, this effect is dramatically exaggerated in comparison to the dynamic merger test in Fig. 4, but the explanation is the same (see $\S4$). Tree building algorithms can detect and repair this variability to some extent (e.g., Behroozi et al. 2013b), regardless of the halo finder used.

HBT, which had shown exemplary performance for the static and dynamic tests (§3 and §4), nonetheless has some issues with mass recovery in the cosmological test. In Fig. 6, it is clear at the beginning (a = 0.64) that all halo finders except for HBT find that the lower halo (corresponding to the leftmost halo in Fig. 5) has a larger mass than the upper halo. At this snapshot, the radii of the two merging haloes are barely touching—so it is not an issue of distinguishing between host and subhalo particle assignment. Instead, haloes which are major mergers tend to accrete mass up to (and sometimes within) the virial radius of the larger halo (Behroozi et al. 2014). Because the corresponding friends-offriends groups "bridge" well before the haloes come into contact (see, e.g., Klypin, Trujillo-Gomez & Primack 2011), HBT limits

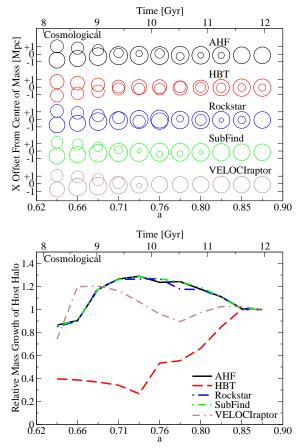


Figure 6. Merger of the two largest haloes shown in Fig. 5. **Top** panel: time series plots of the merger, as returned by the different halo finders (as in Fig. 4). Each circle corresponds to a halo at the given snapshot; circle radii are proportional to the cube root of the halo mass, and the **bold** circle corresponds to the host halo. Results from each halo finder have been spatially offset for clarity. **Bottom** panel: mass growth history of the eventual host halo, normalized to the host halo mass at the last snapshot. The snapshots are equally spaced in scale factor from a = 0.64 to a = 0.87, covering a range of 3.69 Gyr. Each tick mark on the bottom axis corresponds to a separate snapshot.

the growth of the lower halo by allowing it only to consume particles belonging to its original FoF group.

HBT also highlights an important issue with the definition of a halo. Unlike the other halo finders, HBT continues to track the smaller halo as a subhalo until z = 0. However, at this point, HBT finds that the subhalo's position is within 9 kpc of the host, on the same order as the force resolution of the simulation (7 kpc). In addition, the velocity-space offset is only 100 km s⁻¹ from the host, which is very small compared to the velocity dispersion of the host (900 km s⁻¹). Since the mass of HBT's subhalo at z = 0 is 20% of the host mass, *no algorithm* can robustly distinguish the subhalo particles from the host halo particles using phase space information alone. While there is no doubt that HBT's subhalo at z = 0is a self-bound structure, it is not clear that all applications would wish to treat it as separate from its host (see also discussion in §6), especially semi-analytical/abundance matching models and merger rate calculations.

In the lower panel of Fig. 6, we show the mass growth of the host halo. In mergers, the sum of the two progenitor haloes' masses can easily exceed the final halo mass after the merger; this is es-

⁵ The largest halo is still undergoing a major merger at z = 0, so it is not possible to have a clean "before" and "after" comparison.

⁶ http://slac.stanford.edu/~behroozi/MM_Movies/

pecially true in major mergers. Major mergers dramatically raise the velocity dispersion in the resulting merged halo, with the result that many particles are unbound and that many of the remainder spend extended amounts of time orbiting beyond the halo radius (Anderhalden & Diemand 2011; Behroozi, Loeb & Wechsler 2013). As a consequence, the mass of the host increases by the mass of the smaller halo (a = 0.71), but then rapidly falls as the merger raises the velocity dispersion. At the end (a = 0.87), the host mass only increases by 15% compared to its original value. HBT again is the exception here as the two haloes remain clearly separated until a = 0.80, which is when the two centres remain at the same position (Fig. 6, upper panel). The subhalo then starts to transfer its mass to the host, and the end-mass of the merger approaches the result of the other finders.

5.3 Incidence of Major Mergers

As a gauge of the importance of addressing the issues discussed in this paper, Fig. 7 shows the incidence of major mergers as a function of halo mass and redshift.⁷ We define a "major merger" in this section to be a subhalo with v_{max} at least 70% of that of its host. Because v_{max} scales as the cube root of mass, this v_{max} threshold corresponds approximately to a mass ratio threshold of 1:2.9. If we had instead defined "major merger" in terms of a subhalo mass ratio of 1:3, the position-space halo finders would give very different results from the others (Fig. 7, right-hand panels) because they often cannot recover full mass profiles for massive subhaloes (§3). Indeed, due to SUBFIND's conservative approach for assigning particle membership, it finds a factor of over 30 fewer major mergers when using the mass definition as compared to the v_{max} definition. As shown in Fig. 7, the phase-space and temporal halo finders yield similar incidences for the two definitions.

At z = 0, with the v_{max} definition, there is modest agreement between AHF, ROCKSTAR, VELOCIRAPTOR, and SUBFIND that between 2-6% of haloes are experiencing a major merger; larger haloes are slightly more likely to be undergoing a major merger, as they have later formation times (Wechsler et al. 2002). As noted in §5.2, HBT tracks major mergers for significantly longer than the other finders, with the result that its major merger incidence is elevated with respect to the others.

At z = 2, there is significant (1 dex) disagreement in the incidence of major mergers, as well as in the change in incidence compared to z = 0. For $10^{12} M_{\odot}$ host haloes (~ 1000 particles), SUBFIND finds lower incidences of major mergers at z = 2 than at z = 0 (by 0.4 dex), whereas AHF and HBT find similar incidences at z = 2 as at z = 0, and ROCKSTAR and VELOCIRAPTOR find higher incidences at z = 2 than at z = 0 (by 0.4 dex and 0.8 dex, respectively). Given the variance even between similar algorithm classes, this likely reflects significant disagreements over where to truncate subhalo mass profiles (as in the static tests in \S 3). We note that there is apparent convergence in Fig. 7 for the high-mass major merger fraction, but this is illusory: there are not enough haloes in the simulation volume to determine whether or not the halo finders agree above a mass of $5 \times 10^{12} M_{\odot}$. AHF shows a significant rise in the merger fraction as a function of mass at z = 2, which may suggest that its algorithm is sensitive to resolution effects. All other finders follow the theoretical expectation of more self-similar incidences as a function of mass.

We have also briefly investigated the presence of host-subhalo swaps in the merger histories of haloes at z = 0, using the merger trees generated for Avila et al. (2014). We find incidences of 0-20%, which have some dependence on halo mass and halo finder. However, we find that the merger tree algorithm has a much stronger influence on the number of host-subhalo swaps than any other variable (see also Srisawat et al. 2013). Merger tree algorithms that use all particles contained within haloes (i.e., including substructure) to match haloes across timesteps are practically immune to host-subhalo swaps (e.g., MERGERTREE applied to AHF; Knollmann & Knebe 2009), at the expense of discontinuities in halo positions and velocities (Srisawat et al. 2013). The same applies for algorithms which explicitly try to match halo properties across timesteps (e.g., CONSISTENT TREES; Behroozi et al. 2013b). Algorithms that use only uniquely-assigned particles (i.e., excluding substructure) are much more vulnerable to host-subhalo swaps, although they do maintain more consistent halo positions and velocities. Due to the strong dependence on the merger tree algorithm, we postpone further analysis of this to a future paper on the effect of merger tree algorithms on major mergers.

6 DISCUSSION

As we have shown in isolated mergers (§3 and §4), position-space finders cannot accurately recover subhalo masses in major mergers, although recovery of v_{max} is not as severely affected. As shown in §4, phase-space finders may perform better when the merger is in its early stages, but also have problems when the merger is nearing completion. Finally, while temporal algorithms can track halo masses well in the final stages of the merger, the initial masses of the merging haloes may not agree with other approaches (§5.2). It would therefore seem that some kind of hybrid approach is necessary for best accuracy—e.g., phase space when the merging halo can still reasonably gain mass, and temporal tracking once the merging halo is deep within its host. Alternately, information from temporal tracking and phase-space could be weighted in a combined metric for particle assignment.

As discussed in §5.2, temporal tracking of particles raises the issue of when two haloes should be considered to have merged. For smaller mergers, this question is less ambiguous, because tidal stripping removes much of the mass before the merging halo core can sink to the centre. However, in major mergers, the dynamical friction is such that the merging halo reaches the centre of the host halo before tidal stripping removes all the merging halo's mass. When the centres of the two haloes meet in position and velocity space, tidal "stripping" ceases to be well defined; instead, the profiles of the merging halo and the host halo gradually align until they are indistinguishable. While some applications may benefit from continuing to track the merging subhalo past this point (e.g., recovery of tidal streams; Elahi et al. 2013), many others may wish for such subhaloes to be removed or flagged. A reasonable criterion for removal may be when the phase-space ellipse containing the innermost N particles of the subhalo (where $N \sim 30$) also contains more than N particles from the host or other subhaloes.

Section §5.3 shows that the fraction of haloes undergoing major mergers varies by up to a decade across halo finders at z = 2, even when the mergers are tagged by v_{max} instead of by mass. As the recovery of the haloes' v_{max} prior to the merger is very robust, the main interpretation is that the merger

⁷ Note that this is separate from the *frequency* of major mergers, discussed in the introduction. The incidence is the frequency times the average length of time that the merging subhalo remains distinct.

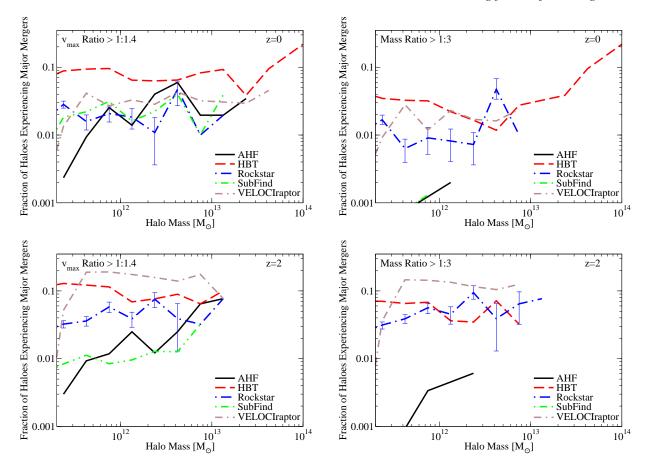


Figure 7. Fraction of host haloes undergoing major mergers as a function of mass. In the left panels, a major merger is defined to be where a subhalo has at least 70% of the v_{max} of its host; this enables fairer comparison with the position-space halo finders. In the right panels, a major merger is defined to be where a subhalo's mass is at least 33% that of its host. Regardless of definition, considerable variation in the reported incidence of major mergers exists at z = 2. Some halo finders did not recover major mergers in all mass bins, so their curves above are truncated accordingly. The error bars show 68% confidence intervals for ROCKSTAR only, to avoid excess clutter; they are not shown in bins where only one major merger was found. Host halo masses of $1.3 \times 10^{11} M_{\odot}$ (left-hand edge of both panels) correspond to 100-particle haloes. For comparison, the typical collapse mass M^* (i.e., where $\sigma(M^*) = 1.686$) is $10^{12.4} M_{\odot}$ at z = 0 and $10^{9.4} M_{\odot}$ at z = 2.

timescales and mass-loss rates differ enormously between different halo finders. Semi-analytical models which depend on major mergers for aspects of galaxy formation (e.g., morphology/size changes, black hole growth, or star formation triggering) may therefore give very different results when using different halo finders. Abundance matching and similar empirical models' predictions for the clustering of massive galaxies and the stellar mass content of clusters (Leauthaud et al. 2012a) may also be affected by the choice of halo finder. Until there exists a reliable method for determining which subhaloes host visible galaxies (see recent progress in Wetzel & White 2010; Watson, Berlind & Zentner 2012; Reddick et al. 2013; Watson et al. 2015), this uncertainty will persist.

7 CONCLUSIONS

We have examined the recovery of host halo and subhalo properties in major mergers across five different halo finders. Our main findings are summarized as:

(i) Position-space finders recover subhalo positions and velocities well, as long as they can detect the subhalo (§3). The recovered subhalo v_{max} is only somewhat biased, but masses are especially difficult to recover accurately (§3, 4, 5).

(ii) Phase-space finders also recover subhalo positions and velocities well, and recover accurate masses in static profile tests (§3). However, in dynamic and cosmological tests, phase differences between the orbiting halo cores and the remaining merger mass can cause large, periodic fluctuations in the recovered subhalo masses (§4 and 5). This primarily occurs when the merger is nearing completion.

(iii) Temporal finders are able to recover positions, velocities, and masses extremely well in isolated merger tests (§3 and 4). However, the algorithm tested here (HBT) does not always reproduce the mass growth history of merging haloes *prior to* the haloes merging (§5.2), when position-space and phase-space finders would be expected to give reliable results. In addition, while HBT tracks mergers for much longer than other halo finders, the resulting subhaloes are not always distinguishable in phase space from the host particles (§5.2).

(iv) The fraction of haloes undergoing major mergers is in relative agreement across halo finders at z = 0 (except for HBT); however, there is strong disagreement (> 1 dex) in this fraction by z = 2.

(v) All halo finders not using some kind of temporal information

show host-subhalo relationship swaps ($\S4$ and $\S5.2$). However, the merger tree algorithm employed can to a large degree eliminate this problem ($\S5.3$).

These findings suggest caution when interpreting results from theoretical models depending on major merger rates at z > 0, and they also suggest that future halo finders have ample room for improvement in their treatment of major halo mergers.

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