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CLASH: accurate photometric redshifts with 14 *HST* bands in massive galaxy cluster cores

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ABSTRACT

We present accurate photometric redshifts for galaxies observed by the Cluster Lensing And Supernova survey with Hubble (CLASH). CLASH observed 25 massive galaxy cluster cores with the *Hubble Space Telescope* in 16 filters spanning 0.2–1.7 μm . Photometry in such crowded fields is challenging. Compared to our previously released catalogues, we make several improvements to the photometry, including smaller apertures, intracluster light subtraction, point spread function matching and empirically measured uncertainties. We further improve the Bayesian photometric redshift estimates by adding a redder elliptical template and by inflating the photometric uncertainties of the brightest galaxies. The resulting photometric redshift accuracies are $dz/(1+z) \sim 0.8, 1.0$ and 2.0 per cent for galaxies with *I*-band *F814W* AB magnitudes $< 18, 20$ and 23 , respectively. These results are consistent with our expectations. They improve on our previously reported accuracies by a factor of 4 at the bright end and a factor of 2 at the faint end. Our new catalogue includes 1257 spectroscopic redshifts, including 382 confirmed cluster members. We also provide stellar mass estimates. Finally, we include lensing magnification estimates of background galaxies based on our public lens models. Our new catalogue of all 25 CLASH clusters is available via Mikulski Archive for Space Telescopes. The analysis techniques developed here will be useful in other surveys of crowded fields, including the Frontier Fields and surveys carried out with Javalambre-Physics of the Accelerated Universe Astrophysical Survey and *James Webb Space Telescope*.

Key words: catalogues – galaxies: clusters: general – galaxies: distances and redshifts – galaxies: clusters: intracluster medium – galaxies: photometry – ultraviolet: galaxies.

1 INTRODUCTION

The Cluster Lensing And Supernova survey with Hubble (CLASH;¹ Postman et al. 2012b, hereafter P12) is a Multi-Cycle Treasury programme awarded with 524 *Hubble Space Telescope* (*HST*) orbits to image the cores of 25 massive galaxy clusters at intermediate redshifts ($0.1 < z < 0.9$). The cluster selection includes 20 X-ray

selected dynamically relaxed systems plus 5 additional specifically selected strong lensing clusters. CLASH has combined the high spatial-resolution imaging from *HST* with a 16-band filter system optimized for photometric redshift estimations (four WFC3/UVIS + five WFC3/IR + seven ACS/WFC) and a typical photometric depth of 20 orbits per cluster. The combination of these three elements has made the CLASH survey an unprecedented legacy data set.

Starting in 2010, CLASH has successfully achieved most of its main science goals. (1) Measuring the profiles and substructures of dark matter in galaxy clusters with unprecedented precision and

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¹ <http://www.stsci.edu/per cent7Epostman/CLASH>

resolution (Zitrin et al. 2011; Coe et al. 2012; Lemze et al. 2012; Umetsu et al. 2012, 2014, 2016; Zitrin et al. 2012b, 2013, 2015; Eichner et al. 2013; Medezinski et al. 2013; Umetsu 2013; Grillo et al. 2014; Meneghetti et al. 2014; Merten et al. 2015 among others). (2) Detecting and characterizing some of the most distant galaxies yet discovered at $z > 7$ (Bradley et al. 2012, 2014; Zheng et al. 2012; Zitrin et al. 2012a; Balestra et al. 2013; Coe et al. 2013; Bouwens et al. 2014; Monna et al. 2014; Pirzkal et al. 2015). (3) Detecting Type Ia supernovae (SNe Ia) out to redshift $z \sim 2.5$ to measure the time dependence of the dark energy equation of state and potential evolutionary effects in the SNe themselves (Rodney et al. 2012, 2016; Jones et al. 2013; Graur et al. 2014; Patel et al. 2014; Strolger et al. 2015). (4) Studying the internal structure and evolution of the galaxies in and behind these clusters (Postman et al. 2012a; Biviano et al. 2013; Annunziatella et al. 2014, 2016; Presotto et al. 2014; Sartoris et al. 2014; Donahue et al. 2015, 2016; Fogarty et al. 2015; Girardi et al. 2015; Grillo et al. 2015; Balestra et al. 2016; Caminha et al. 2016; Maier et al. 2016; Pizzuti et al. 2016) in combination with a spectroscopic follow-up provided by the CLASH-VLT Large Program (Rosati et al. 2014) and wide-field deep multi-band (*ugriz*) ground-based Subaru/Suprime-Cam imaging (Umetsu et al. 2012, 2014).

However, questions remain regarding the photometric redshifts: (1) to understand the unexpected underperformance of the CLASH photo- z and (2) the acquisition of a complete and reliable photo- z catalogue for cluster galaxies in the CLASH fields. As explained in P12, based on simulations of the CLASH filters and exposure times, the photo- z performance was expected to be $\delta z \sim 0.02(1+z_s)$ for 80 per cent of objects with magnitudes $F775W < 26$ AB. Although comparable results have been achieved by similar multi-band photometric surveys (ALHAMBRA; Moles et al. 2008; Molino et al. 2014), the predictions stated in P12 were in disagreement with the results presented in Jouvel et al. (2014, hereafter J14) by almost a factor of 2 (i.e. $\delta z \sim 0.04(1+z_s)$). As emphasized in that paper, although not as precise as originally expected, a ~ 4 per cent precision for the CLASH photo- z may have a subdominant effect on the mass modelling when compared to the uncertainties associated with lensing by large-scale structure along the line of sight, supporting the reliability of conducting such analysis.

As discussed through this work, standard aperture photometry on massive cluster fields does not provide as accurate photometric redshifts as expected from field galaxy simulations, where the only source of uncertainty is assumed to be the photometric noise from images. Unlike field samples where galaxies are mostly isolated (apart from pairs, merging systems or projected neighbours) over an almost flat background, galaxies in the cores of massive cluster fields are immersed in a fluctuating background signal mainly dominated by the brightness of the brightest cluster galaxies (BCGs) and the intracluster light (ICL). In deep images of very massive galaxy clusters, as the ones acquired for CLASH, this additional signal (BCG+ICL, hereafter BCL) becomes noticeable and if not properly removed from the images (or included in the simulations as an additional uncertainty), it disrupts the real colour of galaxies deteriorating the expected performance of photometric redshifts. As the BCL emission is (generally) dominating and (typically) inhomogeneous, the background estimation on images becomes a non-trivial task. This BCL light varies spatially across the image showing both small- and large-scale structure. This fact complicates its modelling and subtraction since very smoothed maps may not account for the signal between close galaxies and highly resolved maps may over-subtract light from the brightest galaxies. An example of the BCL

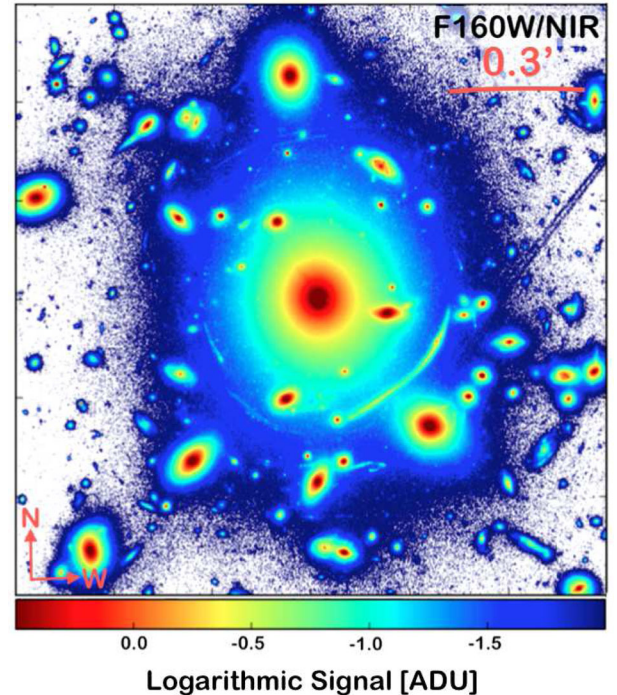


Figure 1. Example of the typical ICL+background signal contaminating the colours of the galaxies in the *F160W/NIR* image within the cluster Abell 383 ($z_s = 0.187$).

signal for the galaxy cluster Abell 383 ($z_s = 0.187$) is shown in Fig. 1.

From a practical point of view when performing aperture photometry, once the sources are detected and their corresponding apertures defined, all remaining pixels on an image are automatically assumed to make part of the background. For the case of the CLASH observations, the BCL signal may well be spread over the entire *HST*/WFC3 Field of View (FoV) (~ 1 arcmin) contaminating a significant fraction of the pixels used to define the sky level in images. The intensity of this BCL emission increases with wavelength. Therefore, depending on the properties of a specific cluster and the particular passbands it has observed, photometric colours of galaxies embedded in these haloes may turn automatically biased. Whereas for the *HST*/ACS filters in the CLASH images this effect is moderate (but not negligible), in the near-infrared (NIR) it becomes especially significant causing an asymmetric noise distribution (with a long tail) towards positive values. This asymmetric excess signal, which cannot be explained by any instrumental background, corresponds to the BCL. If not removed from images, it must be considered as an additional source of noise (uncertainty) when estimating expected fluxes from galaxies.

Based on all the aforementioned facts, the final observed magnitude (m_i) of a given galaxy in the i th passband on a particular CLASH field needs to be described as

$$m_i = m_i^o + \delta m_i^{\text{rms}} + \delta m_i^{\text{BCL}}, \quad (1)$$

where m_i^o represents the real flux of the galaxy, δm_i^{rms} the additional instrumental noise (depending on the total exposure time and filter response) and δm_i^{BCL} to the (additional) signal from the BCL (depending on each cluster and passband). Not including this additional source of uncertainty when predicting photo- z performance may lead to a severe overestimation of the real photo- z depth of any survey. In this work, we suggest an approach to minimize the impact

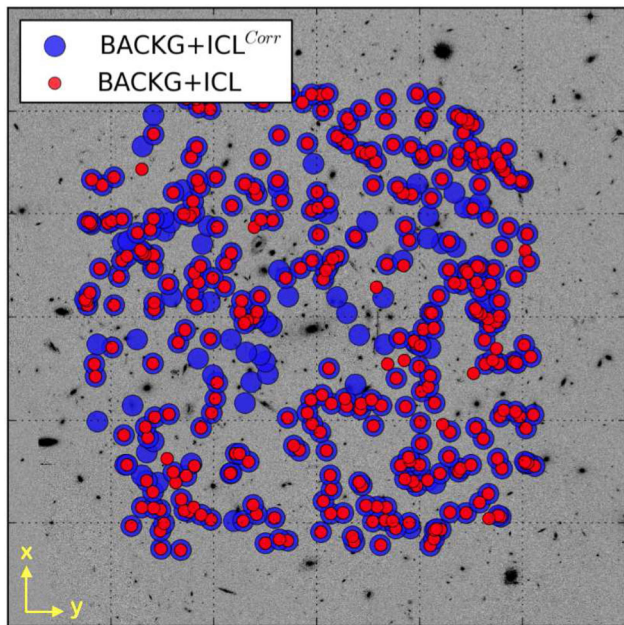


Figure 2. The figure illustrates how the detectability of faint sources on dense environments can be compromised due to the BCL signal. Faint galaxies from the UDF were injected inside our CLASH clusters. The fraction of detected galaxies was compared before (red dots) and after (blue dots) modelling + subtracting this BCL light. The cleaning processing served as much to increase the detectability of sources as to improve the measured colours of galaxies.

of the BCL signal on our images improving the overall photometry of cluster galaxies.

Another intervening problem when performing photometry on dense environments concerns the detection of faint sources. As already seen in Fig. 1, innermost regions of massive clusters are strongly dominated by the BCL emission. In certain cases, this signal may be so intense that small and faint galaxies can be completely undetected by SExtractor (Bertin & Arnouts 1996). This effect is illustrated in Fig. 2 where a sample of galaxies from the Ultra-Deep Field (UDF; Beckwith et al. 2006) are injected in a CLASH image and the fraction of extracted galaxies by SExtractor is compared when the BCL signal is removed or not. As expected, when the BCL signal is not subtracted (red circles) from images, the fraction of retrieved galaxies is significantly smaller than the case when this BCL signal is modelled and removed (blue circles). Since a large fraction of faint (magnified) galaxies are present in these clusters, this artificial selection effect needs to be seriously considered and fixed. Otherwise, estimations such as luminosity functions for high- z galaxies may be biased as noted in analyses of Frontier Fields clusters (e.g. Oesch et al. 2015; Bouwens et al. 2016; Livermore, Finkelstein & Lotz 2017).

There exists another problem when performing aperture-matched photometry over large wavelength ranges. For the particular case of cluster galaxies, the enormous colour indices between the bluest (UV) and the reddest (NIR) filters make standard aperture definition very inefficient. The definition of an aperture for a galaxy in a cluster based on a deep NIR band leads to an artificial deterioration of the signal-to-noise (S/N) in the bluest bands, an effect that directly impacts the overall photometric quality of the survey and eventually underperforms any photo- z estimations.

Finally, as thoroughly discussed in Sections 3.4 and 4.4, there is another (usually unnoticed) effect impacting the quality of

photo- z estimates in dense environments. An inaccurate description of the photometric uncertainties in images, for both bright and faint detections, may cause a significant bias in the redshift distribution of faint background galaxies ($n(z)$) and an artificial deterioration of the photo- z precision for high-S/N galaxies.

Given the complexity of deriving accurate photometry on massive galaxy clusters, the goal of this paper is to propose a new approach to improve the photometry of galaxies in dense environments. This paper is organized as follows: in Section 2, we describe the CLASH data set utilized in this work. The pipeline adopted here to derive accurate photometry in clusters is presented through Section 3. This includes the definition of new photometric apertures to enhance the S/N of galaxies in the bluest filters, an efficient subtraction of the ICL from images, a point spread function (PSF) homogenization of images based on empirical PSF models and a discussion about the importance of deriving accurate photometric uncertainties when computing photometric upper limits. Afterwards, the code utilized for photometric redshift estimations is presented in Section 4, including a short discussion about (1) the necessity of including an extra template to fully cover the colour space of galaxies in clusters, (2) the observed zero-point corrections required to match data and models, (3) the spectroscopic redshift sample used to characterize the photo- z estimations, (4) the final performance obtained for galaxies in clusters and (5) the impact of inaccurate photometric uncertainties when computing photo- z estimations for high-S/N galaxies. Finally, Section 5 is devoted to the description of the photometric redshift catalogue and Section 6 to the discussion of the final results and conclusions.

Unless specified otherwise, all magnitudes here are presented in the AB system. We have adopted the cosmological model provided by Planck Collaboration XVI (2014) with parameters $H_0 = 70 \text{ km s}^{-1} \text{ Mpc}^{-1}$ and $(\Omega_M, \Omega_\Lambda, \Omega_K) = (0.315, 0.673, 0.00)$.

2 OBSERVATIONS

CLASH is a Multi-Cycle Treasury programme awarded with 524 *HST* orbits to image the cores of 25 massive galaxy clusters at intermediate redshifts (see Table 1). The observations made use of both the Wide Field Camera 3 (WFC3; Kimble et al. 2008) and the Advanced Camera for Surveys (ACS; Ford et al. 2003) on board *HST*, as illustrated in Fig. 3. An optimized photometric filter system was selected for the estimation of photometric redshifts, composed of 16 overlapping broad-bands, spanning a wavelength range from the near-ultraviolet (2000 Å) to NIR (17 000 Å): four filters from the WFC3/UVIS, five from WFC3/IR camera and seven from ACS/WFC. With an averaged exposure time of $\sim 2500 \text{ s}$ (one to two orbits) per image (or 20 orbits per cluster if all filters are included), the observations reach a typical photometric depth of $F814W=28.0$ or $F160W=26.5$ ($S/N > 3$).

Image reduction, alignment and co-adding was done using the MosaicDrizzle pipeline (Koekemoer et al. 2003, 2011), where a final scale of $0.065 \text{ arcsec pixel}^{-1}$ was chosen for all the fields. Weight and rms maps were also computed and utilized during the photometric extraction of sources and the local estimation of noise in images. The reduced images and weight maps are available at Mikulski Archive for Space Telescopes (MAST).²

² <https://archive.stsci.edu/prepds/clash/>

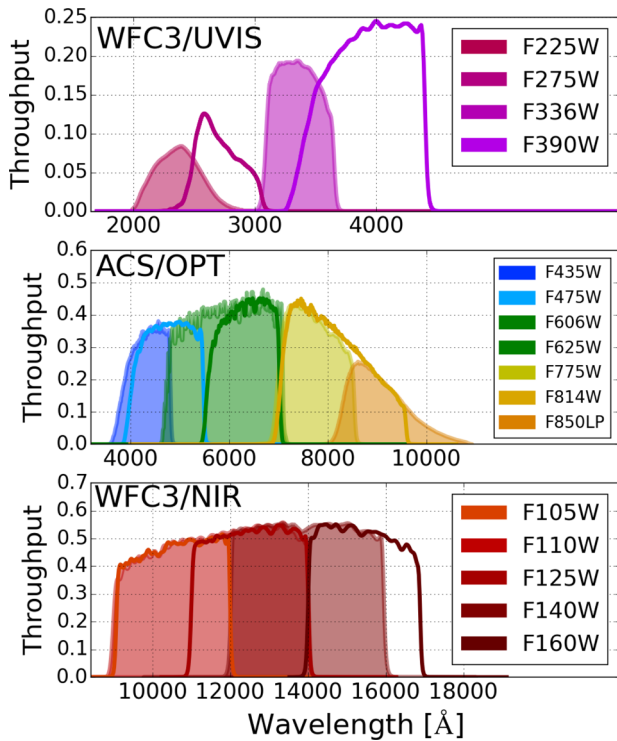


Figure 3. The CLASH photometric filter system. It covers the whole UV+optical+NIR wavelength range combining 16 broad-bands (BB) from two different cameras: four BB from WFC3/UVIS (top), even BB from ACS/WFC (middle) and five BB from WFC3/NIR (bottom).

3 MULTIBAND PHOTOMETRY

This section is devoted to the explanation of how a multi-band aperture-matched PSF-homogenized photometry has been performed on all 25 clusters. In particular, in Section 3.1, we discuss the convenience of adopting a different set of apertures with respect to the ones typically utilized for photo- z estimations, to improve the photometry of cluster galaxies by enhancing the S/N at the shortest wavelengths. In Section 3.2, the adopted approach to generate PSF-homogenized images across filters is introduced. Section 3.3 describes the methodology applied to remove the ICL from our images improving the overall photometric quality. Finally, a precise recalibration of the photometric uncertainties along with the estimation of accurate photometric upper limits for our photo- z estimations is discussed through Sections 3.4 and 3.5.

3.1 Aperture photometry on clusters

Standard aperture-matched photometry on massive galaxy clusters (mainly dominated by early-types) does not provide as accurate photo- z estimations as for field galaxies. When the spectral energy distribution (SED) of an early-type galaxy is simultaneously observed from the UV to the NIR, it shows large colour indices ($\Delta m > 5$ mag). In the case of the CLASH observations, cluster galaxies practically vanish in the shortest wavelengths (UV) while still preserving a high S/N in the reddest (NIR) filters. When a photometric aperture is defined for these galaxies according to a deep NIR image and the aperture is transported to images with shorter wavelengths (shorter than the $\lambda < 4000$ Å break at rest frame), the so-defined apertures are systematically much larger than the entire galaxies. These ill-defined apertures artificially reduce the S/N of galaxies in the bluest filters (especially in the UV), making the

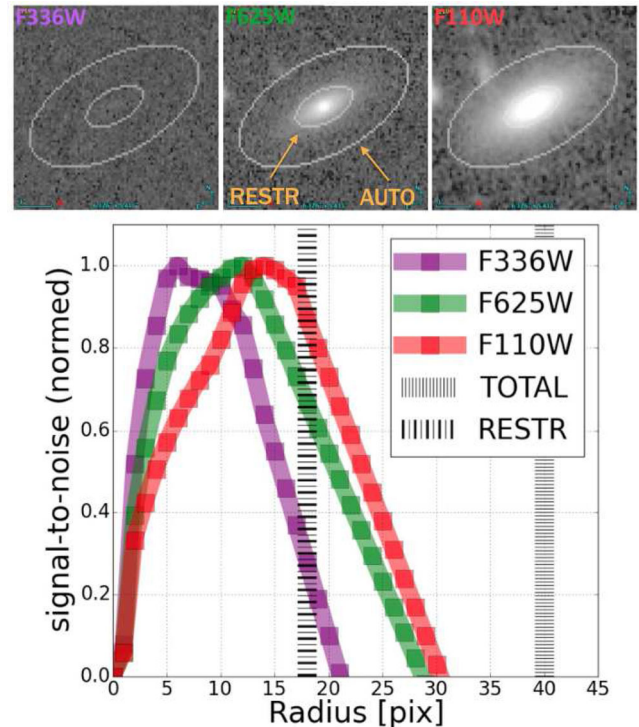


Figure 4. Photometric apertures (I): upper panel shows an example of an inefficient photometric aperture for an early-type galaxy. Apertures defined based on deep NIR images are systematically much larger than the galaxies in the shortest wavelengths. This effect artificially reduces the S/N in those bands that has a direct impact on the photo- z estimations. The effect is illustrated in the lower panel where the S/N as a function of the aperture radius is plotted for an early-type galaxy in three different bands (UV/purple, optical/green and NIR/red). Whereas standard SExtractor_AUTO (total) apertures include all light from galaxies, they provide a reduced S/N in the shortest wavelengths. The effect can be mitigated adopting total restricted apertures that provide more accurate colours for photo- z estimations.

photometry enormously noisy and uncertain. This issue is illustrated in the upper panel of Fig. 4, where a SExtractor_AUTO aperture is overlaid on top of the galaxy in three different filters (F336W/UV, F625W/OPT and F110W/NIR). It is worth emphasizing that this effect has nothing to do with differences in the PSF among images. It is a rather specific problem of early-type galaxies observed through a large wavelength range (as the one adopted in CLASH). The fact that early-type galaxies usually represent a subdominant population in deep field galaxy surveys (mainly dominated by late-type galaxies with moderate colour indices) explains why standard aperture photometry generally yields more accurate photo- z estimations than those obtained specifically in massive cluster fields.

In order to circumvent this situation and be able to derive an enhanced photometry for cluster galaxies in the bluest filters, we adopted a new set of photometric apertures. On the one hand, we define total restricted apertures by forcing SExtractor to define total (AUTO) magnitudes with the smallest radius possible, i.e. setting the SExtractor PHOT_AUTOPARAMS³ parameter to a value of 1.0, 1.0. These restricted apertures have the advantage of integrating most of the light from the galaxies while

³ The PHOT_AUTOPARAMS serves to regulate the definition of an elliptical aperture around every detection.

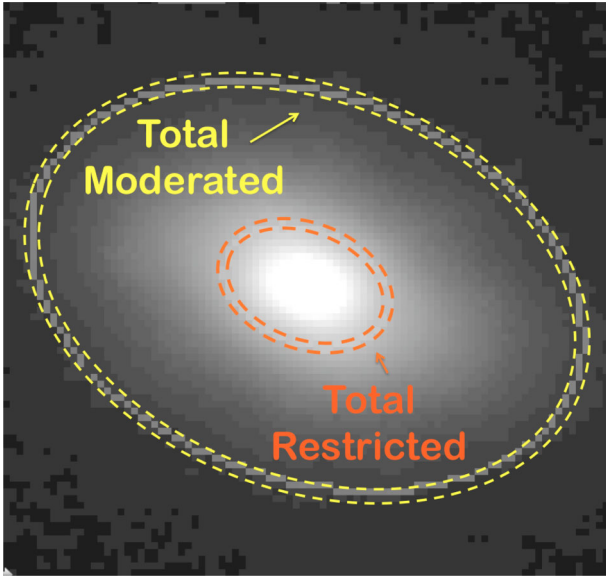


Figure 5. Photometric apertures (II): in order to be able to derive unbiased physical properties from the galaxies (such as stellar masses, ages or metallicities), we also defined total moderate apertures to integrate (almost) all light from the galaxies while reducing potential contamination from neighbours. The figure compares the double set of photometric apertures adopted in this work.

keeping a higher S/N than the standard `SEXTRACTOR_AUTO` magnitudes. This effect is illustrated in the lower panel of Fig. 4, where the S/N of a galaxy within two photometric apertures (`AUTO` and `restricted`) is compared in three different filters. We preferred to adopt these `restricted` apertures rather than the standard `SEXTRACTOR_ISO` magnitudes since the latter are more sensitive to small variations in the PSF across images (see discussion in Section 3.2).

On the other hand, in order to integrate all light from galaxies and be able to derive unbiased physical properties (such as stellar masses, ages or metallicities), we decided to include a secondary set of apertures. In this case, we defined total moderate apertures by forcing `SEXTRACTOR` to define total (PETRO) magnitudes with apertures not larger than the distance at which the S/N of galaxies drops to zero in the detection images, i.e. setting the `SEXTRACTOR_PHOT_AUTOPARAMS` parameter to a value of 2.0, 1.0. These apertures, similar to the standard `SEXTRACTOR_AUTO` magnitudes but slightly smaller, served to integrate (almost) all light from the galaxies while reducing potential contaminations from neighbouring galaxies. Fig. 5 shows an example of both sets of apertures (i.e. `restricted` and `moderate`) adopted in this work.

As explained in Section 5, the final photometric catalogue includes both types of photometries derived on the 16 bands. In this work, total `restricted` magnitudes were used for photo- z estimations (Section 4) whereas total `moderate` magnitudes will be applied in a separate paper (Molino et al., in preparation) to derive physical properties of cluster galaxies (such as ages, metallicities, extinctions or stellar masses).

3.2 PSF homogenization

In order to deal with the differences in the PSF among filters and derive an accurate aperture-matched photometry, we decided to homogenize the whole set of images to a common PSF value. For the case of CLASH, we chose to bring it to the broader

PSF condition given by the WFC3/IR camera. To do so, we relied on the `IRAF psfmatch` routine (Phillips & Davis 1995) to compute the convolution between different images. Basically, this routine computes an empirical kernel between two PSF models (one model from the original image to be degraded and one model for the final PSF condition to be reached) previous to the convolution process.

In order to execute the `psfmatch` routine, it was necessary to generate PSF models for every individual image.⁴ To achieve this goal, we carefully scanned the 25 clusters seeking for high-S/N stars. Each star was then double-checked to assure that it was neither photometrically saturated nor too close to another bright neighbour within a 25-pixel square box around the star (i.e. within the PSF-model grid size). Finally, the remaining sample of 131 stars was combined and normalized in every band to produce the PSF models shown in the lower panel of Fig. 6. A certain spatial and temporal PSF variability is expected for the *HST* images; however, since the `IRAF psfmatch` routine cannot handle more than a PSF model per image, we opted to build empirical ‘averaged’ models combining stars from different locations (always within the *HST* WFC3/IR FoV) and from different epochs rather than using position-dependent models (like Tiny-Tim; Krist 1993). Although a $\delta\text{PSF} < 3$ per cent scatter was observed based on this compilation of stars, the photometric apertures adopted in this work (Section 3.1) should be less sensitive to these small position-dependent differences.

3.3 ICL subtraction

Galaxies within the cores of massive cluster fields are immersed in a fluctuating background signal mostly dominated by the brightness of the BCG and the ICL. If this light is not properly removed from images, it may seriously disrupt the colour of the galaxies deteriorating the performance of photo- z estimations. In order to diminish this nuisance effect, in this work we decided to remove this additional signal from our images previous to the computation of the photometry. To do so, we initially started using `SEXTRACTOR` to derive background maps directly from our images that would be eventually subtracted from the former.⁵ The fact that the BCL light shows both large- and small-scale structure made its modelling complicated since very smoothed maps may not account for the signal between close galaxies and highly resolved maps may oversubtract light from the brightest galaxies. After testing different configurations for `SEXTRACTOR`, we concluded that in order to effectively remove the BCL signal from the galaxies, we need to use aggressive background configurations (deriving high-resolution maps). However, this approach turned out not to be ideal since most light from the brightest galaxies was unwillingly removed, biasing the photometry of a large fraction of the galaxies.

For this reason, we decided to rely on the `CHEFS` software (Jiménez-Teja & Benítez 2012; Jiménez-Teja et al. 2015; Jiménez-Teja & Dupke 2016), which is one of the state-of-the-art codes for galaxy modelling. Basically, this software utilizes a library of Chebyshev–Fourier mathematical functions in a non-parametric fashion to efficiently model the light surface distribution of

⁴ These PSF models are available at the following website: <https://archive.stsci.edu/prepds/clash/>

⁵ If requested `SEXTRACTOR` can compute background maps from images (`CHECKIMAGE_TYPE=BACKGROUND`). These maps can be used afterwards to generate background-free images.

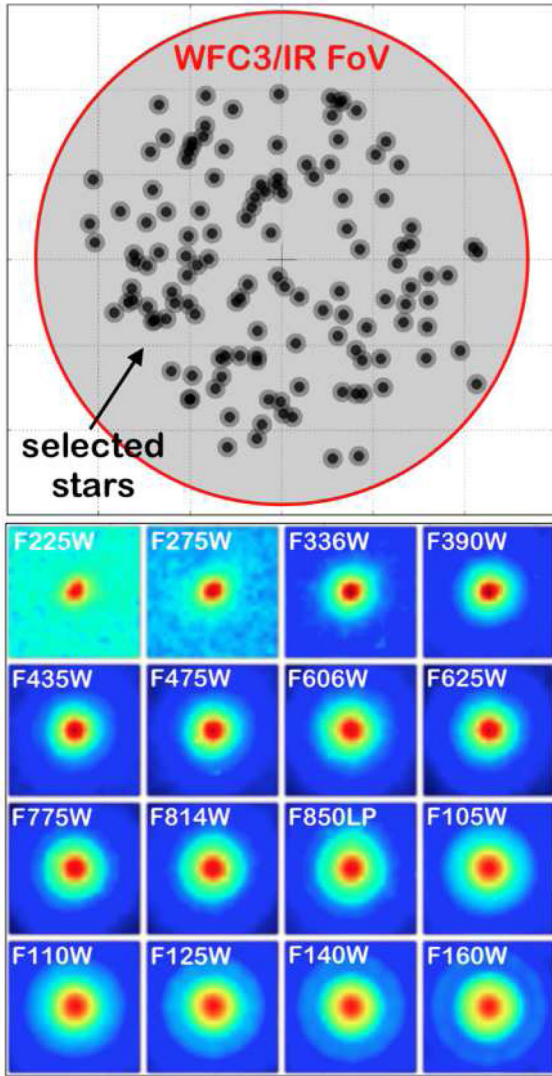


Figure 6. To perform accurate aperture-matched photometry across bands, we decided to bring all images to a common PSF condition using the `psf-match` routine from IRAF. To do so, we selected a total of 131 stars within the WFC3/IR FoV from different clusters (top) to derive empirical PSF models for every filter (bottom).

galaxies irrespective of their morphologies (we refer the interested reader to the aforementioned papers for more details about the software). In order to provide the CHEFS with a complete list of sources to model (and remove) in every image, we initially ran SExtractor on the deep NIR detection images using an aggressive background configuration to detect as many galaxies as possible. Based on the resulting source catalogue, afterwards we ran the CHEFS on every science image to model and subtract every detection. This process served to compute ICL maps per image and cluster.⁶ Finally, these ICL maps were subtracted from the original images deriving ‘background-free’ images to be used for the final photometry (Section 3.1). Fig. 7 shows an example of this ICL cleaning for a group of small galaxies in the A209 cluster.

⁶ These multi-wavelength ICL maps will be presented in a separate paper.

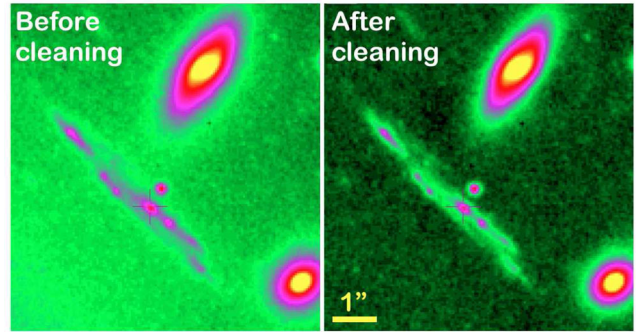


Figure 7. In this work, we utilized the CHEFS software to derive multi-wavelength ICL maps per cluster. These maps were removed from the images before performing the photometry. The figure shows an example of this ICL cleaning for a group of small galaxies in the A209 cluster.

3.4 Photometric uncertainties (I)

It is known that SExtractor systematically underestimates the photometric uncertainties of sources due to the fact that science images (usually) undergo several processing steps (dithering, degradation, stacking, registration, etc.), which introduces correlations between neighbouring pixels. This correlation makes the background noise different from a Poisson distribution and so the SExtractor uncertainties no longer accurate (see Molino et al. 2014 for an extended discussion). Besides the estimation of the instrumental noise in images, as stressed in Section 1, the original colours of galaxies embedded in massive clusters are expected to be altered due to the presence of the BCL signal. Since this secondary source of ‘noise’ cannot be accounted by SExtractor, the combination of both effects may lead to a severe underestimation of the real photometric uncertainties.

In order to retrieve a robust photometry for CLASH, we decided to explore up to what extent the uncertainties reported by SExtractor were accurate and how much these uncertainties may be reduced after the modelling and removal of the ICL signal from images. To tackle these questions, we followed a similar approach as that presented in Section 1 injecting galaxies from the UDF in our images and quantifying how much the original magnitudes of these galaxies would change simply because they were now observed through a different background condition. It is worth noting that the so-derived magnitude variations (input minus output) represent a direct and clean quantification of the real photometric uncertainties taken place on our images.

Initially, we confirmed that the uncertainties reported by SExtractor were accurate for images with a background noise well described by a Poisson distribution. To do so, we utilized the `mknoise` routine from IRAF to background-scale the UDF image to the level of the CLASH depth by adding Poisson noise, i.e. making the original magnitudes from the UDF galaxies as noisy as the galaxies in the CLASH fields. On this new image, we ran SExtractor in dual-image mode using the original UDF image for detections (to prevent changes in the magnitudes due to differences in the apertures), and compared the variation in the SExtractor total (MAG_AUTO) magnitudes (δ_m) with the reported photometric uncertainties (MAGERR_AUTO). As seen in Fig. 8, a good agreement was found between uncertainties (dashed black line) and empirical magnitude variations (grey solid line).

Later on, we repeated the same exercise but now injecting the UDF galaxies in both the original and the new ‘background-free’ CLASH images (see Section 3.3). As seen in Fig. 8, the

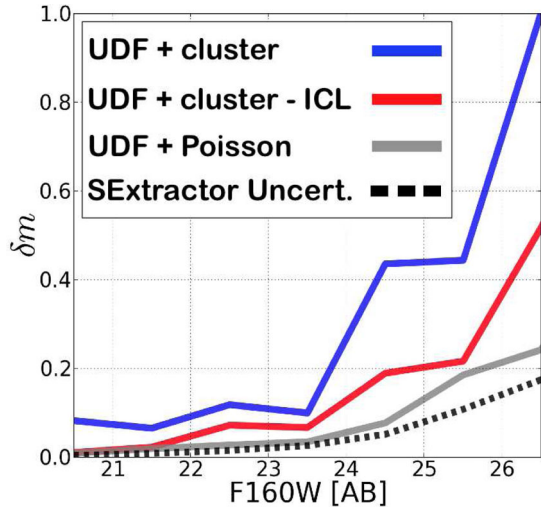


Figure 8. To study the reliability of SE_{EXTRACTOR} deriving photometric uncertainties, galaxies from the UDF were injected in our images under different background conditions: instrumental background plus BCL (blue), instrumental background minus BCL (red) and pure Poisson background (grey). The observed variation of their original magnitudes (δm) as a function of a reference magnitude ($F160W$) showed that the uncertainties reported by SE_{EXTRACTOR} were only accurately described for the Poisson case, but they were clearly underestimated for the CLASH images. As expected, the ICL subtraction (red) quantitatively improved the quality of our original photometry (blue).

photometric bias induced by the clusters (blue line) was always much larger than the uncertainties reported by SE_{EXTRACTOR}. Although subtracting the ICL signal served to quantitatively mitigate this difference (red line), in both cases the reported uncertainties were severely underestimated.

In the light of the previous results, we decided to rely on an empirical approach similar to those followed by Casertano et al. (2000), Labbé et al. (2003), Gawiser et al. (2006), Quadri et al. (2007), Molino et al. (2014) or Nieves-Seoane et al. (2017) to correct the photometric uncertainties. Basically, the idea behind these methods is the following: every detected object by SE_{EXTRACTOR} in the detection image is masked out using the SE_{EXTRACTOR} segmentation map. Then $\sim 50\,000$ apertures are thrown over the remaining (blank) area, measuring both the enclosed signal and the rms inside it. The procedure is repeated for apertures in the 1–250 pixel range, correcting appropriately by the total exposure time of the pixels belonging to them using the weight maps. As a result, we observed two effects. Although the CLASH images were accurately described by a Poisson distribution on small scales, on larger scales the rms start departing from the SE_{EXTRACTOR} expectations indicating the presence of correlations among pixels. In order to quantify the importance of the ICL in this analysis, we repeated the same exercise on the original images. As expected, in this case, we observed an asymmetric background signal enclosed within the apertures, becoming especially intense for the reddest filters (NIR). This long tail of positive values caused by the BCL was making the noise distribution in images no longer Gaussian.

3.5 Photometric upper limits

Photometric upper limits represent the minimum detectable signal from an astronomical image. These magnitudes are important pieces of information when computing photo- z estimations,

serving as much to constrain the colour-redshift space (i.e. narrowing the posterior redshift probability distribution function, PDF) as to reduce the fraction of catastrophic outliers (Section 4). By construction, an upper limit depends on the adopted photometric aperture (A), on the noise properties of images (σ_{rms}) and on the significance for the detection to be considered real. These parameters are related as shown in the following equation:

$$\text{mag}_{\text{upp}}^{n-\sigma} = -2.5 \times \log(n \times \sigma_{\text{rms}}) + \text{zp}_i, \quad (2)$$

where σ_{rms} denotes the one-sigma interval estimated from the noise distribution within a given aperture, n the number of requested sigmas for the limiting magnitudes and zp_i the photometric zero-point.

Taking into account that upper limits are noise-dependent estimations, we investigated how inaccurate descriptions of photometric uncertainties might affect its definition. Based on equation (2), we initially compared the expected differences in magnitude for our upper limits if they were derived assuming a Poisson-like behaviour for the background noise (as SE_{EXTRACTOR} does) or using a rather empirical estimation of it (see Section 3.4). To compute these quantities, we calculated first the typical sizes of non-detected galaxies in the bluest filters. To do so, we ran SE_{EXTRACTOR} in dual-image mode on the $F336W$, $F390W$ and $F435W$ images using the corresponding NIR detection image for both detections and aperture definitions. We observed that galaxies with magnitudes $m = 99$. (i.e. non-detected) had typical sizes of 10–70 pixels, with an average value of ~ 20 pixels. Converting these sizes into apertures, we found a difference of $\delta m = 0.5$ for galaxies as small as 8 pixels or a $\delta m = 1.0$ for galaxies as large as 16 pixels. As expected, these differences decreased for smaller apertures since it is precisely on the smallest scales where the background noise recovers its Poisson distribution.

Assuming these numbers to be representative, we designed a set of simulations to understand the impact of these biased upper limits on our photo- z estimates. To do so, we generated mock catalogues simulating the red sequence of a galaxy cluster at different redshifts. Each sample, composed of 500 galaxies, was perfectly reproducing as much the colours of the BPZ early-type templates (Section 4) as the magnitude selection function observed in our images. We perturbed the model magnitudes according to the real noise of images but we set the photometric uncertainties according to SE_{EXTRACTOR}. Finally, we derived (biased) upper limits for non-detected galaxies and reran BPZ.

We noticed that these faulty upper limits were artificially increasing the spectral break of our simulated galaxies, forcing BPZ to favour high- z solutions due to a misclassification between the Balmer (4000 Å) and the Lyman (912 Å) break. As illustrated in Fig. 9, this effect was causing a small fraction of the simulated cluster galaxies (vertical grey bar) to be shifted at $z > 3.0$, leading to an artificial excess (small red peak) in the redshift distributions $n(z)$. The fraction of misclassified galaxies varied from 2 to 4 per cent for galaxies with a $\delta m = 0.75$ mag or $\delta m = 1.0$, respectively. It is worth noting that this artificial peak had already been reported in previous catalogues but the source of this signal was unclear. The new definition of upper limits adopted in this work dramatically mitigates this problem, retrieving more accurate distribution of background galaxies. Based on what has been stated before, we conclude that this effect should not be ignored for massive cluster fields as those of CLASH. Photo- z estimates for non-detected faint galaxies due to either the ICL or the proximity to a bright neighbour may be severely biased if their magnitudes are replaced by faulty upper limits.

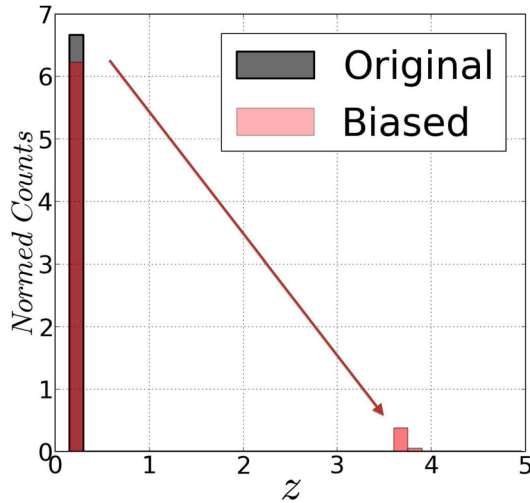


Figure 9. Bias in the $n(z)$ of background galaxies due to inaccurate upper limits. Mock catalogues for cluster galaxies at different redshifts (vertical grey bar) were generated to explore the impact of faulty upper limits when computing photo- z estimates. As illustrated in the figure, underestimated photometric errors, leading to overestimated upper limits in the shortest wavelengths, were forcing BPZ to favour high- z solutions due to a misclassification between the Balmer and the Lyman break. The bias causes an accumulation of cluster galaxies at $z > 3$ (vertical red bar).

4 BAYESIAN PHOTOMETRIC REDSHIFTS

We calculate photometric redshifts (photo- z) using an updated version of the Bayesian photometric redshift (BPZ) code (Benítez 2000; Coe et al. 2006), which includes several changes with respect to its original version (see Molino et al. 2014 for more details). A new library composed of six SED templates originally drawn from *Projet d’Étude des GALaxies par Synthèse Évolutive* (Fioc & Rocca-Volmerange 1997) but then recalibrated using FIREWORKS photometry and spectroscopic redshifts (Wuyts et al. 2008) to optimize its performance. In addition to these basic six templates, four GRaphite and SiLiCate (GRASIL; Panuzzo et al. 2005) and one starburst template have been added. As explained in Section 4.1, an additional early-type template (EL1 in Fig. 10) was required to fulfil the colour space of the reddest cluster galaxies. Therefore, the library used in this work includes six templates for elliptical galaxies, two for spiral galaxies and four for starburst galaxies along with emission lines and dust extinction. The opacity of the intergalactic medium was applied as described in Madau (1995).

The BPZ2.0 also includes a new empirically derived prior by the redshift distributions measured in the GOODS-MUSIC (Santini et al. 2009), COSMOS (Scoville et al. 2007) and UDF (Coe et al. 2006) catalogues. This prior has proved to provide excellent results in deep field surveys (Molino et al. 2014). However, since the cluster galaxies considered in this work are (typically) clustered at certain redshift ranges with peculiar magnitude distributions, we preferred to apply a ‘flat’ (rather than the standard luminosity-based) prior on both galaxy type and redshift. A new empirical prior optimized for cluster galaxies will be presented in a separate paper. Likewise, the BPZ2.0 provides either an estimation of the galaxy stellar mass (obtained by applying the colour- M/L ratio relationship established by Taylor et al. 2011) or an estimation of the absolute magnitudes according to the most likely redshift and spectral type per galaxy.

We evaluate the performance of our photo- z estimates using the normalized median absolute deviation (NMAD) since it manages to

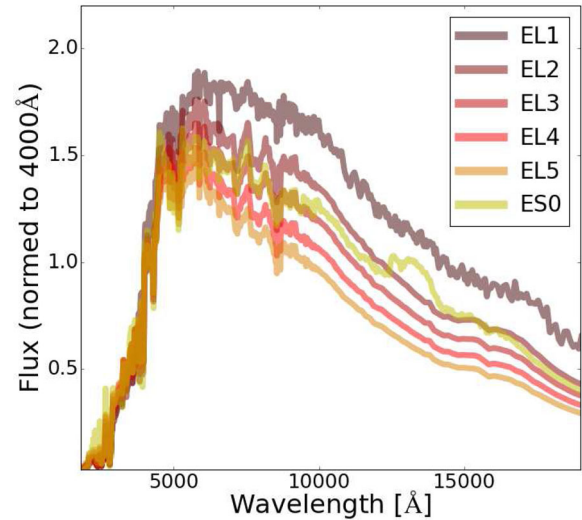


Figure 10. SED templates of early-type galaxies utilized in this work. In order to fulfil the colour space of galaxies in clusters, it was necessary to incorporate an additional template (EL1) to the original library of BPZ2.0 for very red galaxies.

get a stable estimate of the spread of the core of photo- z distribution without being affected by catastrophic errors making the photo- z error distribution to depart from a pure Gaussian distribution. Along with the scatter from the error distribution, it is also important to control any systematic bias μ in the redshift distribution and to quantify the fraction of (potential) catastrophic errors. The NMAD is defined as

$$\sigma_{\text{NMAD}} = 1.48 \times \text{median} \left(\frac{|\delta z - \text{median}(\delta z)|}{1 + z_s} \right) \quad (3)$$

being z_b the photometric redshift, z_s the spectroscopic redshift and $\delta z = (z_b - z_s)$. In this work, we adopt the following definition for catastrophic outliers:

$$\eta = \frac{|\delta z|}{1 + z_s} > 5 \times \sigma_{\text{NMAD}}. \quad (4)$$

Among other factors, the photo- z precision depends on the number of filters a galaxy is observed through (Benítez et al. 2009). In order to define ‘homogeneous photo- z samples’, we selected only those galaxies falling within the area covered by the 16 filters, i.e. within the WFC3/IR FoV. Although this criterion may reduce the survey effective area, it guarantees that the galaxies were observed under similar circumstances (in terms of number of orbits and wavelength coverage). Meanwhile, we decided to exclude the UVIS/F225W and UVIS/F275W filters when running BPZ2.0. Although these filters might have served to break possible redshift degeneracies, its limited depth was actually worsening as much the overall photo- z precision as the fraction of catastrophic outliers.

4.1 An extension of the BPZ library of templates

While characterizing the quality of our photo- z estimates, we noticed that several cluster galaxies were retrieving unexpectedly poor photo- z estimates (when compared to others of similar magnitudes). In order to understand the origin of such dispersion, we ran BPZ2.0 again on the whole spectroscopic sample (Section 4.2) but using this time the ‘ONLY_TYPE=yes’ mode to redshift the entire library of templates to the corresponding redshift and be able to compare the

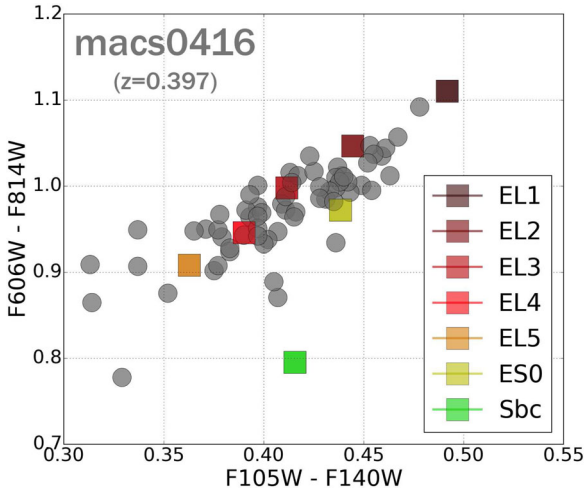


Figure 11. Example of the colour-colour diagram for both the BPZ2.0 library of templates (squares) and galaxy colours (grey circles) for MACS0416. As seen in the image, it was necessary to include a new redder template (EL1) to the original library for the reddest galaxies in the clusters.

predicted and the observed colours according to the most likely template. When representing the colour difference between models and data as a function of the (previously estimated) photo- z error, we found an (almost) linear relation between the two. This trend was indicating that several galaxies with peculiar colours (outside to colour space covered by the BPZ2.0 templates, see Fig. 11) were retrieving unexpectedly poor photo- z . It is worth noting that since BPZ2.0 has to converge to a solution, the only way for the code to compensate such peculiar colours was to artificially shift the library of templates up and down in redshift to find a solution minimizing the differences between data and models. This effect was causing the photo- z estimates to show a rather large scatter around the cluster redshift.

To solve this issue, we used the template set of SEDs of luminous red galaxies (LRGs) from Greisel et al. (2013)⁷ to identify a potential new template capable of reproducing the observed colours of these very red galaxies. In every cluster, we identified all cluster galaxies outside the BPZ2.0 template colour space and estimated the mean colour of such population. Then we redshifted the library of LRG models to the cluster redshift, computed their expected colours and kept the three templates providing closer matches. After repeating the same exercise for the 25 clusters, we ended up selecting the most favoured template (`sed_fit_restframe_z02_507.sed`) and incorporating it to our library. After rerunning BPZ2.0, we noticed that the new template was indeed improving the SED fitting for such galaxies (retrieving a lower χ^2 value) and broadening the spectral-type distribution of red galaxies in clusters and that the photo- z error was considerably reduced. An in-depth analysis of the physical properties of these galaxies will be addressed in a separate paper, investigating the possibility of being dusty star-forming galaxies (Wolf, Gray & Meisenheimer 2005); a particular type of SED not included in most libraries of galaxy models.

⁷ These models, specifically selected to match the Sloan Digital Sky Survey (SDSS) colours at different redshift bins, are generated by superposing model SEDs of composite stellar populations with a burst model, allowing both components to be reddened by dust.

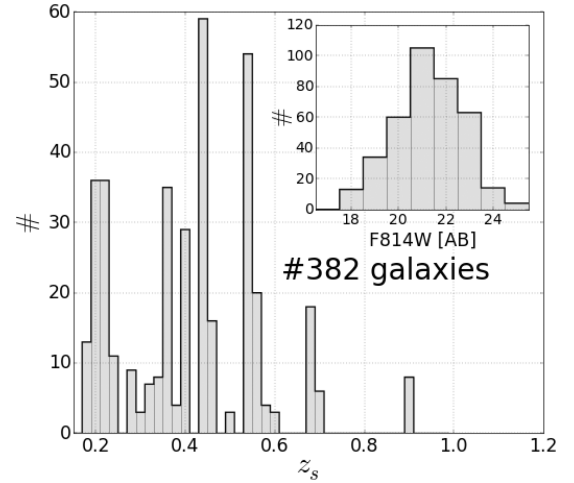


Figure 12. In order to characterize the photo- z precision of our photometry, we compiled a sample of 382 galaxies spectroscopically confirmed to be cluster members. This control sample covers the entire $0.1 < z < 0.9$ redshift range of the CLASH clusters (main panel) and a range of $17 < F814W < 25$ in magnitude (inset panel).

4.2 Performance on cluster members

In order to be able to characterize the final precision achieved for our photo- z estimates, it was necessary to compile a sample of galaxies with spectroscopic redshifts. The CLASH survey has been awarded with 225 h of time on the Very Large Telescope (VLT) as a part of a ESO Large Program (CLASH-VLT; PI: Piero Rosati) using the Visible Multi-Object Spectrograph (VIMOS; Le Fèvre et al. 2003) to obtain a spectroscopic follow-up for 2000–4000 galaxies (as much cluster members as faint lensed galaxies) for each of the 13 southern clusters over a 20–25 arcmin FoV (Rosati et al. 2014). Spectroscopic targets were selected down to $R = 24$ AB magnitude, with a colour selection based on two or three colours, which however is wide enough to include the full range of galaxy. The success rate in measuring reliable redshifts is typically around 75 per cent, averaged over all magnitudes ($R < 24$). The efficiency in recovering galaxy members varies from 50 per cent in the core to $\lesssim 10$ per cent in the cluster outskirts (at approximately two virial radii), and also depends on cluster richness. We refer the reader to Balestra et al. (2016) for a further explanation about the spectroscopic target selection. It is worth noting that although one of the four VIMOS pointings was constantly locked on the cluster cores, allowing long exposures on the lensed galaxies (between 30 min and 4 h), due to the complexity of allocating so many slits inside the WFC3/FoV (~ 1 arcmin), only a few hundredth objects in a limited number of clusters were available within the innermost part of the CLASH clusters.

Along with the VLT data, in this paper we also collected spectroscopic redshift measurements from the Grism Lens-Amplified Survey from Space (Schmidt et al. 2014; Treu et al. 2015) and NASA/IPAC Extragalactic Database. A final sample of 382 spectroscopically confirmed galaxies within the WFC3/FoV over the 25 CLASH clusters was selected to estimate the performance of the CLASH photo- z estimations. This selection was made imposing two criteria: (1) the galaxies had to be detected at least on 14 bands (out of 16) to guarantee a good sampling of their SED and (2) the differences between the galaxy and the cluster redshift had to be smaller than (or equal to) 0.01 (i.e. $|z_g - z_{cl}| \leq 0.01$). As illustrated in Fig. 12, this control sample covers the entire $0.1 < z < 0.9$ redshift

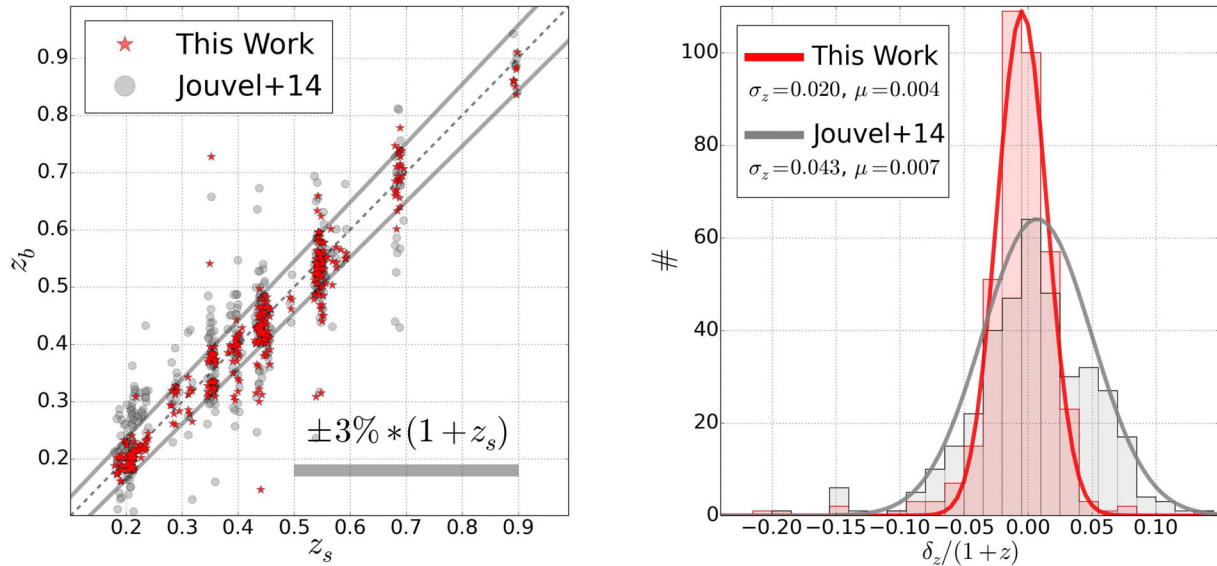


Figure 13. The CLASH photometric redshift accuracy for cluster members (I). Left: the figure compares the photometric redshift performance, as a function of the real spectroscopic redshift values, derived in this work (red stars) with those from our previous pipeline (J14, grey circles). This new photometry provides more accurate estimates reducing the typical observed scatter of cluster galaxies around the cluster redshift. Right: the figure compares the photo- z error distribution function derived in this work (red) with that from our previous pipeline (grey). This new photometry yields an overall precision of $\sigma_z=0.020$ (compared to the previous $\sigma_z=0.042$), representing a factor of 2 improvement.

range of the CLASH clusters ($\langle z \rangle = 0.41$) and a range in magnitude of $17 < F814W < 25$ ($\langle m \rangle = 21.3$).

Based on this sample, our new photo- z estimates reach an accuracy of $dz/(1+z) \sim 0.8$ per cent for galaxies brighter than magnitude $F814W < 18$, a $dz/(1+z) \sim 1.0$ per cent for galaxies brighter than magnitude $F814W < 20$, a $dz/(1+z) \sim 1.6$ per cent for galaxies brighter than magnitude $F814W < 22$ and a $dz/(1+z) \sim 2.0$ per cent for galaxies brighter than magnitude $F814W < 23$. Globally, this sample yields an accuracy of $dz/(1+z) \sim 2.0$ per cent with an averaged magnitude $\langle F814W \rangle = 21.3$. The fraction of catastrophic outliers is always below 3 per cent except for the faintest magnitude bin ($23.5 < m < 24.5$) where the S/N of galaxies makes the photo- z estimation more uncertain. In terms of the redshift, the sample reaches an accuracy of $dz/(1+z) \sim 1.0$ per cent for galaxies at redshifts $0.1 < z < 0.3$, of $dz/(1+z) \sim 2.2$ per cent for galaxies at redshifts $0.3 < z < 0.5$ and of $dz/(1+z) \sim 2.4$ per cent for galaxies at redshifts $0.5 < z < 0.7$. These results are illustrated in Figs 13 and 14 and summarized in Table 2. When this precision is compared to that presented in J14, we find (almost) a factor of 2 improvement at all magnitudes. As shown in Fig. 13, this improvement can be as high as a factor of 3 for high-S/N galaxies ($F814W < 20$).

In order to verify that $dz/(1+z)$ is representative for the spectroscopic sample, the cumulative distribution of $dz/(1+z)$ is represented in Fig. 15. We observed that an additional multiplicative factor (f) needs to be applied to our estimates to retrieve the ~ 64 and ~ 90 per cent of the photometric redshifts within the formal 1σ and 2σ confidence interval, respectively. The corrections, shown in Fig. 15, indicate that the photo- z accuracy is a bit underestimated (< 0.5 per cent) at bright magnitudes and a bit overestimated (> 0.5 per cent) at faint magnitudes. Table 2 includes the expected accuracy for the CLASH photo- z with and without applying this additional factor.

4.3 Photometric zero-point calibrations

It is now customary for most groups deriving photo- z estimations to end up performing some sort of photometric zero-point correc-

tions on the input photometry. Although they neatly improve the final photo- z performance (in terms of both accuracy and fraction of outliers), the provenance of these corrections is most times uncertain (see Molino et al. 2014 for an in-depth discussion). Main explanations range from systematic differences among colours of stars and galaxies (to compensate unnoticed biases while performing the multi-band photometry), systematic issues during the data reduction process or as a consequence of faulty calibrations of galaxy models since different libraries typically yield slightly different corrections.

When using template-based photo- z codes, it turns out possible to compare the expected and the observed colours (fluxes) for the galaxies. If the photometry is assumed to be accurate, the library of models reliable (in terms of both calibration and completeness) and the galaxy redshifts are known (so the templates can be redshifted to those values), the observed scatter between expected and measured colours is supposed to be solely caused by the inherent photometric noise in images. Since this background signal can be approximated as a normal distribution with null mean ($\mu = 0$), the dispersion between colours (i.e. the ratio among fluxes) is therefore expected to be also a normal distribution with mean equal 1 ($\mu = 1$) and a dispersion proportional to this background noise. If that assumption applies, any statistical deviations ($\mu \neq 1$) are assumed to be an instrumental zero-point offset to be corrected.

In general, empirical galaxy templates are typically calibrated (and tested) using large samples of galaxies at different redshift and magnitude ranges. That is why, these models provide accurate photo- z estimations on average. However, considering the reduced sample of galaxies with spectroscopic redshifts in the cores of our 25 clusters along with their particular redshift distribution (galaxies clustered at specific ranges), it turns out risky to try to systematically recalibrate the photometric zero-points for each cluster individually. There is no guarantee that the templates will faithfully reproduce the colours of galaxies at a very specific redshift (see Section 4.2). In those situations, the so-derived corrections may certainly improve the photo- z precision for a subsample of

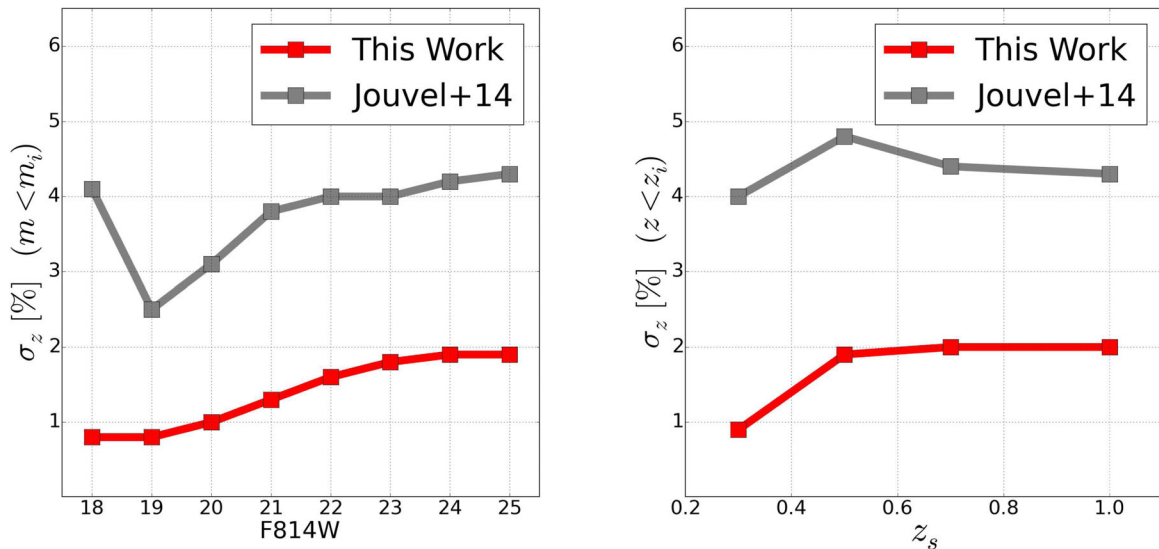


Figure 14. The CLASH photometric redshift accuracy for cluster members (II). Left: the figure compares the cumulative photometric redshift accuracy for cluster members (σ_z), as a function of an apparent magnitude ($F814W$), achieved in this work (red) with that from our previous pipeline (grey). This new photometry not only provides a higher overall precision at all magnitudes (an overall factor of 2 or up to a factor of 4 at $F814W=18$) but also (an expected) meaningful distribution of values as a function of the S/N (magnitude). Right: similarly, the figure compares the cumulative photometric redshift accuracy for cluster members (σ_z), as a function of the redshift, achieved in this work (red) with that from our previous pipeline (grey). Again, this new photometry not only provides a higher precision at all redshift bins (an overall factor of 2 or up to a factor of 4 at $z < 0.3$) but also a meaningful distribution of values as the galaxies become statistically fainter at higher redshift.

galaxies but they could artificially lead to biases for other galaxies at different redshifts.

The photometric zero-point of an instrument is, by definition, the magnitude of an object that produces 1 count s^{-1} (Sirianni et al. 2005). These instrumental quantities are therefore independent of the observed targets. If there was a real zero-point offset in a given data set, it would indicate that different galaxy populations might agree on the corrections to be applied. In order to explore the need of zero-point offset for our photometry, we followed a similar approach as that presented in Molino et al. (2014) where the spectroscopic- z sample is divided into several categories according to their colours, redshifts and magnitudes. Whereas the first two analyses might flag issues with the library of models, the last one might indicate issues with the photometry.

Initially, we separated the whole sample among foreground, cluster and background galaxies and re-estimated offsets per subsample. Since these populations mainly correspond to different galaxy templates, finding similar offsets may indicate that the observed bias is not caused by the library of models. It is worth recalling that the three categories will include galaxies at different redshift ranges, making the corrections less sensitive to particular template calibration issues at specific redshifts.⁸ As seen in Fig. 16, we observe a clear trend in the computed offsets as a function of the wavelength, from the optical to the NIR, indicating that galaxies are systematically fainter than expected by the models. Whereas this effect is barely observed in the optical range ($6000 < \lambda < 9000 \text{ \AA}$), it becomes clearer in the NIR ($\lambda > 10000 \text{ \AA}$). Although background galaxies (blue line) deviate more than other types in the NIR, the three categories show the same pattern. Therefore, we think this effect might not be assigned to the models.

Later on, we separated the sample into three similar-size magnitude bins: $17 < F814W < 21$, $21 < F814W < 23$ and $23 < F814W < 25$ and re-estimated the offsets. As before, each subsample may in-

clude galaxies with different colours and redshifts, making the offsets less sensitive to the library of models. In this case, similar corrections might point to the photometry as the main reason for the observed bias. As seen in Fig. 17, the average (black) line shows the same trend, although a clear spread in magnitude is observed. Whereas for bright galaxies the deviation is notably reduced at all wavelengths, the effect is dramatically increased for the faintest galaxies.

Finally, we separated the sample into different redshift bins: $z < 0.3$, $0.3 < z < 0.5$, $z > 0.5$ and re-estimated the offsets. As in the former cases, although a certain colour-magnitude evolution is expected for the galaxies as a function of redshift, each subsample may include galaxies at different magnitudes and colours (cluster members and background galaxies), making the corrections less sensitive to the models. As seen in Fig. 18, we observe a similar result as that obtained when segregating the galaxies according to their apparent magnitudes. Again, we observe the same wavelength-dependent pattern in the data, where low- z galaxies show a moderate bias at all wavelengths while high- z galaxies seem to deviate more from the expectations. This result is consistent with that obtained when dividing galaxies per magnitude bin, since low- z galaxies will be (in average) brighter than galaxies at high z .

As a complementary analysis, we investigated if the background subtraction from images might be responsible for those offsets. Initially, we restored the background signal removed by SExtractor from the galaxies and re-computed the offsets. Unfortunately, this additional signal was incapable of alleviating the tension between data and models. Secondly, we reran SExtractor without performing any background subtraction at all from the images. As illustrated in Fig. 19, although we observed in this case that the differences between data and models in the NIR were slightly reduced, the magnitudes in the optical were showing the opposite behaviour, i.e. increasing the tension between data and models.

In the light of what has been presented above, there seems to be several explanations. Perhaps, the simplest one would be due to inaccuracies during the PSF homogenization of images. We observe

⁸ The BPZ library of templates was calibrated using optical HST data.

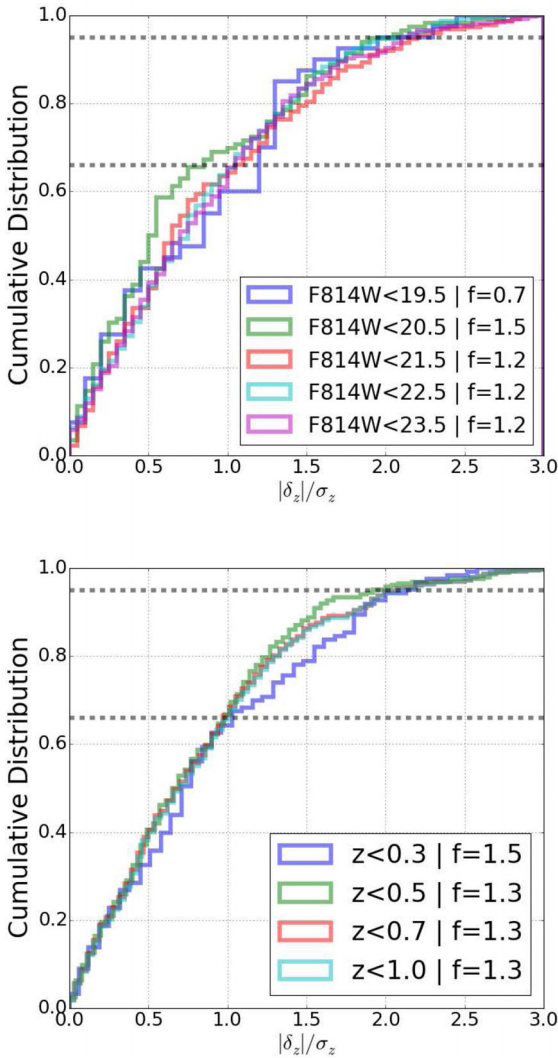


Figure 15. The CLASH photometric redshift accuracy for cluster members (III). The figure shows the cumulative photo- z error distribution function for six different magnitude (upper) and four redshift (lower) bins. Horizontal dashed grey lines correspond to the ~ 64 and ~ 90 per cent within the formal 1σ and 2σ confidence interval, respectively. An additional multiplicative factor (f) is needed for the distributions to describe a Gaussian function. These corrections may indicate that the photo- z precision may either be a bit underestimated (<0.5 per cent) at bright magnitudes or a bit overestimated (>0.5 per cent) at faint magnitudes.

that the offsets get worse at shorter and longer wavelengths with respect to the ACS/*F775W* band that happens to have a sharper PSF than the WFC3. Another interpretation may be a tension between the BPZ models and data since the former does not include specifically any physical evolution and the bias increases with redshift. Finally, since the bias increases as the S/N of galaxies decreases, there could be an instrumental issue with the WFC3 camera where, at a faint count regime and long wavelengths, the detector departs from linearity not integrating as much photons as expected. Similar systematics have been reported from other modern astronomical imagers (Antilogus et al. 2014; Guyonnet et al. 2015). This scenario will be explored in a separate paper using the data from the CANDELS (Grogin et al. 2011; Koekemoer et al. 2011) fields.

Irrespective of the source of these offsets, it is important to emphasize that averaged zero-point corrections (using the whole

Table 1. The CLASH galaxy cluster sample.

Cluster	$\langle z_s \rangle$	RA	Dec.
		(deg/J2000)	(deg/J2000)
Abell 383	0.187	42.0141	−03.5293
Abell 209	0.209	22.9689	−13.6112
Abell 1423	0.213	179.3223	33.6109
Abell 2261	0.224	260.6134	32.1324
RX J2129+0005	0.234	322.4165	00.0892
Abell 611	0.288	120.2367	36.0566
MS2137−2353	0.310	325.0631	−23.6611
RX J1532.8+3021	0.345	233.2241	30.3498
RX J2248−4431	0.348	342.1832	−44.5309
MACS J1931−26	0.352	292.9561	−26.5758
MACS J1115+0129	0.352	168.9663	01.4986
MACS J1720+3536	0.387	260.0698	35.6073
MACS J0429−02	0.399	67.4000	−02.8852
MACS J0416	0.397	64.0356	−24.0733
MACS J1206−08	0.439	181.5506	−08.8009
MACS J0329−02	0.450	52.4232	−02.1962
RX J1347−1145	0.450	206.8776	−11.7526
MACS1311	0.494	197.7575	−03.1777
MACS J1423.8+2404	0.545	215.9490	24.0793
MACS J1149	0.544	177.3980	22.3980
MACS J0717	0.548	109.3880	37.7493
MACS J2129+0005	0.570	322.3600	−07.6923
MACS J0647	0.584	101.9620	70.2481
MACS J0744+39	0.686	116.2200	39.4574
CL J1226+3332	0.890	186.7427	33.5468

Table 2. Comparison of the photometric redshift performance for a spectroscopically confirmed sample of 428 clusters as a function of both apparent magnitude in the *F814W* and redshift. Original results from J14 are marked as $\sigma_{z,o}$.

<i>F814W</i>	σ_z	$\sigma_{z,o}$	μ_z	#	η (per cent)
$18.5 < m < 19.5$	0.008	0.036	0.004	34	0.0
$19.5 < m < 20.5$	0.013	0.032	−0.001	60	0.0
$20.5 < m < 21.5$	0.016	0.030	0.000	105	0.9
$21.5 < m < 22.5$	0.020	0.044	0.008	86	1.2
$22.5 < m < 23.5$	0.022	0.051	0.013	63	3.2
z_{sp}	σ_z	$\sigma_{z,o}$	μ_z	#	η (per cent)
$0.10 < z < 0.30$	0.009	0.040	0.005	108	0.0
$0.30 < z < 0.50$	0.022	0.046	0.007	161	2.5
$0.50 < z < 0.70$	0.024	0.029	0.005	105	2.9
$0.70 < z < 1.00$	0.011	0.020	0.014	8	0.0

spectroscopic sample at once) may not improve the overall quality of the CLASH photo- z , only benefiting a fraction of the galaxies. Meanwhile, the photometric redshift performance presented in Section 4.2 was estimated after applying these empirical magnitude-dependent offsets to the original photometry. It is worth noting that after implementing these corrections, the overall photo- z precision was dramatically improved. An example of the obtained SED-fitting for an early-type cluster galaxy with the new photometry is shown in Fig. 20. Tables A3–A5 summarize the observed magnitude offsets presented during this section.

4.4 Photometric uncertainties (II)

While checking the quality of our photo- z estimations, we found an unexpectedly large fraction of catastrophic outliers (see Section 4) at bright magnitudes. We noticed that several well-isolated

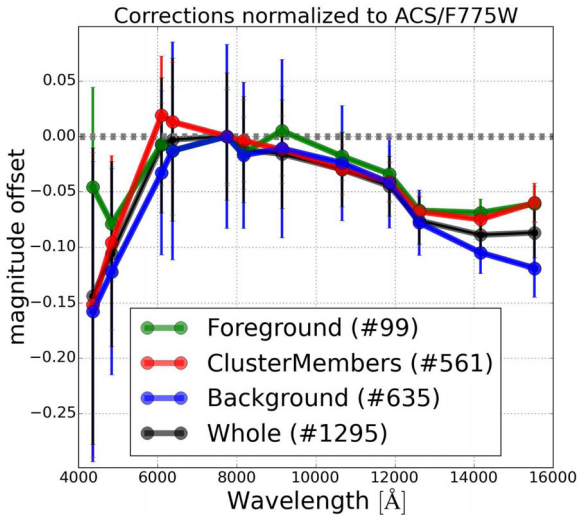


Figure 16. Magnitude corrections for the *HST* data (I). The figure shows the magnitude corrections derived as a function of wavelength from a sample of 1295 galaxies with known spectroscopic redshifts. The sample is divided into four groups: foreground (green), cluster (red), background (blue) and all (black) galaxies. A trend is observed for all types of galaxies indicating that NIR magnitudes are systematically fainter than those expected by the BPZ models.

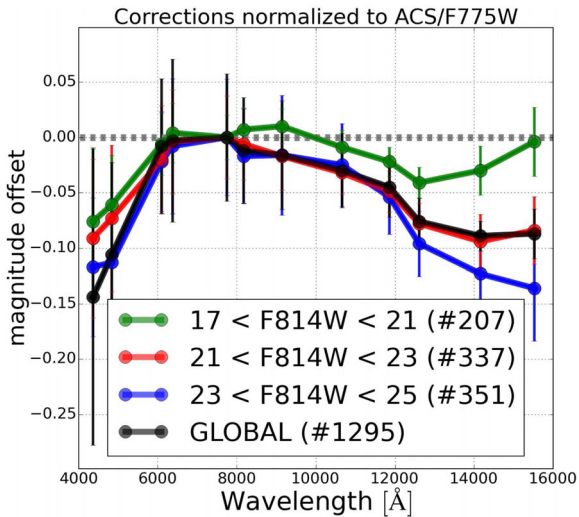


Figure 17. Magnitude corrections for the *HST* data (II). The same as in Fig. 16 but dividing the sample into three magnitude bins: $17 < F814W < 21$, (green), $21 < F814W < 23$ (red) and $23 < F814W < 25$ (blue). As before, a systematic trend is observed with wavelength showing a clear spread in magnitude where fainter galaxies depart more from models.

early-type galaxies with high S/N and secure photometry (according to SExtractor) were getting completely wrong redshift estimates. After a careful inspection of the PDF of each galaxy, we noticed that usually the redshift distribution of these galaxies did not even include the correct redshift value, i.e. suggesting that the (real) redshift of the galaxy was incompatible with the observed colours.

As discussed in Section 4.3, when using photo- z codes based on model fitting, it becomes feasible to compare expected colours from models with real data if the redshift of the galaxies is known beforehand. When these differences are weighted by its corresponding photometric noise, the final error distribution is supposed to be well approximated to a Gaussian function with mean equal to 1 irre-

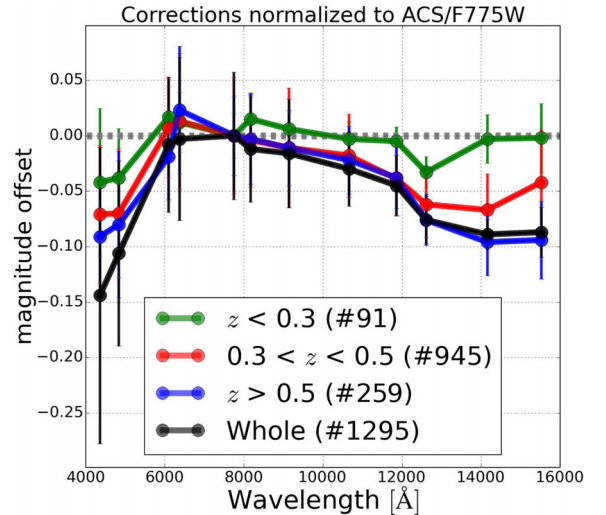


Figure 18. Magnitude corrections for the *HST* data (III). The same as in Figs 16 and 17 but dividing the sample into three redshift bins: $z < 0.3$ (green), $0.3 < z < 0.5$ (red) and $z > 0.5$ (blue). Once again, a systematic trend is observed with wavelength where high- z galaxies show a large deviation from expectations.

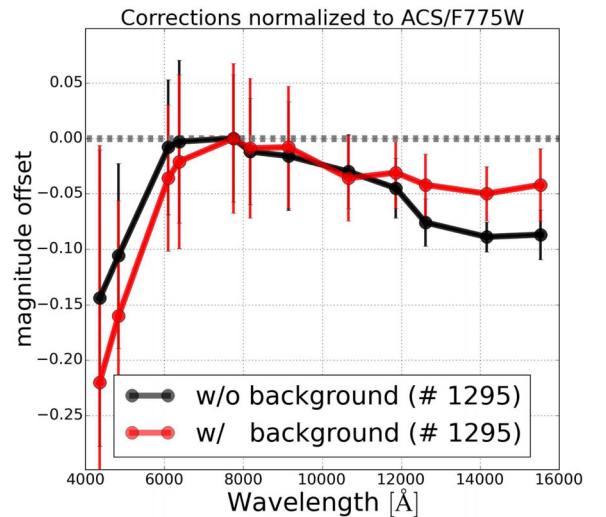


Figure 19. Magnitude corrections for the *HST* data (IV). The same as in Figs 16–18 but showing the magnitude corrections derived after (black) and before (red) removing the BCL signal from images. Once again, a systematic trend is observed with wavelength. Whereas the differences between data and models in the NIR were slightly reduced in this case, the magnitudes in the optical were showing the opposite behaviour.

spective of the magnitude range. This simple comparison encodes the level of agreement (or disagreement) between data, models and photometric uncertainties. We discovered that due to the fact that the photometric uncertainties were enormously underestimated for those bright sources, the BPZ code was unable to properly map out the entire redshift–spectral type (z – T) space when computing the likelihood, causing the analysis to stack in a relative (not necessarily an absolute) minimum. When projected in redshift space (marginalizing over types), this effect was causing the resulting $p(z)$ to be (generally) unimodal but placed at the wrong position. Importantly, this faulty unimodal $p(z)$ was artificially making the Odds parameter from the BPZ to be high (meaning high confidence) but with a completely wrong redshift, making it unfeasible

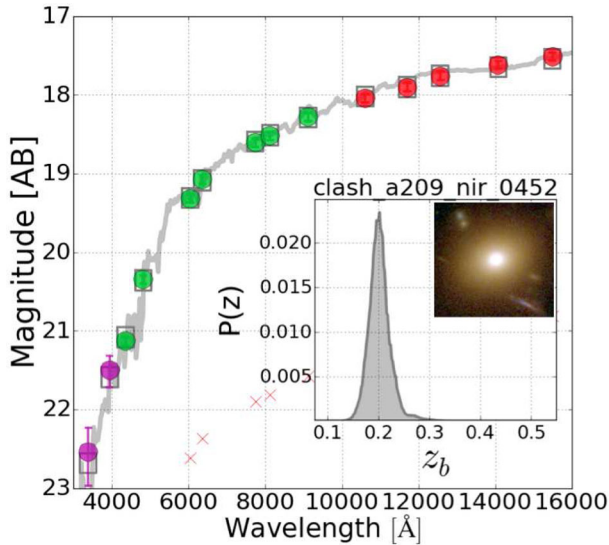


Figure 20. The figure shows an example of the obtained SED fitting for an early-type cluster galaxy with the new photometry derived in this work, where different wavelength ranges are represented with different colours (UV/purple, optical/green and NIR/red). Inset panel shows the corresponding single-peak redshift PDF $P(z)$.

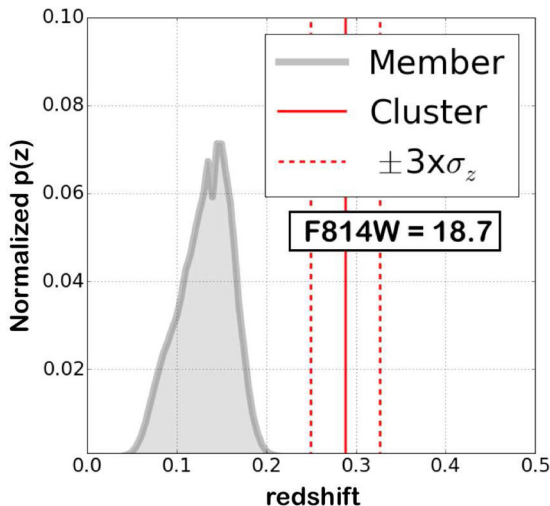


Figure 21. Example of a faulty unimodal $p(z)$ for a bright galaxy. Underestimated uncertainties were preventing the BPZ code to fully map out the z - T space, causing the likelihood to stack in a relative (nor necessarily an absolute) minimum. These biased single-peak distributions were artificially making the Odds parameter to be high (large confidence) despite the wrong photo- z estimates. The problem was circumvented after adding an additional term in quadrature to the photometric uncertainties.

to rely on this parameter to select accurate and reliable samples. This is the reason why in J14 it was not possible to reliably isolate accurate photo- z estimates for bright cluster galaxies using the Odds parameter. This effect is illustrated in Fig. 21 where we show the PDF of a cluster galaxy and the $3 \times \sigma_z$ interval around the cluster redshift.

In order to circumvent this problem, it was necessary to add an additional noise term in quadrature to the photometric uncertainties in every band to make the aforementioned distributions to compensate the differences between models and data. The noise terms were derived using all the spectroscopically confirmed cluster galaxies

with magnitudes brighter than $F814W < 20$. The exact nature of this excess noise (or uncertainty) is unclear but reflects the fact that the dominant error for these bright objects is no longer Poisson noise. It may be due to non-reported systematics when computing our photometry (such as imperfect PSF homogenization) or a tension between data and models at very high S/N (i.e. an imperfect library of galaxy models) as discussed in Coe et al. (2006).

5 PHOTOMETRIC REDSHIFT CATALOGUE

We have run BPZ on this new CLASH photometry to generate a new photometric redshift catalogue for the 25 CLASH massive galaxy clusters. The catalogue, described in this section, includes astrometric, morphologic, photometric and photo- z information for all detected sources in an NIR detection image (e.g. a weighted sum of WFC3/IR images: $F105W$, $F110W$, $F125W$, $F140W$, $F160W$).

Unique IDs are given to every detection according to the detection image and the cluster field from which it was detected following the next criteria: ID = clash_clj1226_nir_0001 stands for clash (*HST* programme) + clj1226 (galaxy cluster) + nir (photometric aperture defined according to the NIR detection image) + 0001 (SExtractor_ID). Both astrometric and geometrical information is therefore derived from its corresponding NIR detection image. The catalogue includes several parameters regarding both astrometric and morphological information from sources: celestial coordinates (RA,Dec) in the J2000 system, physical position on the CCD (X,Y), photometric aperture size (AREA), compactness (FWHM), the signal-to-noise ($s2n$) defined as $SEXT_FLUX_AUTO/SEXT_FLUXERR_AUTO$ on the detection image, standard SExtractor photometric flags (photoflag), the number of filters a source was observed (nfobs) and detected (nfd), a point-source flag (Points), basic shape parameters (a , b and θ), the signal subtracted as background (Backg), Kron apertures (r_k), fraction-of-light radii (r_f), Petrosian apertures (r_p), celestial coordinates of cluster's BCG (BCG_pos_RA, BCG_pos_Dec) and a projected physical distance (PhyDist-BCG) from each detection to the cluster BCG in units of Mpc.

The catalogue contains a double photometry (as explained in Section 3.1) where magnitudes (and uncertainties) are named according to the effective filter wavelength, the camera and the adopted photometric aperture. Here we present a few examples: $F225W_WFC3_PHOTOZ$ corresponds to the AB magnitudes for the $F225W$ filter on board the WFC3 camera. PHOTOZ refers to the total restricted apertures used to derive photo- z estimations (Section 3.1). Likewise, $F225W_WFC3_MASS$ corresponds to the AB magnitudes for the $F225W$ filter where MASS corresponds to the total moderate apertures used to derive absolute magnitudes and stellar masses. Photometric uncertainties take the same name (as magnitudes) but adding the prefix 'd': dF225W_WFC3_PHOTOZ and dF225W_WFC3_MASS. For both sets of magnitudes, photometric uncertainties are empirically corrected (Sections 3.4 and 4.4) in all the 16 bands. Whenever a source was not detected, its magnitude was set to 99. and its photometric uncertainty replaced by a 3σ upper limit (Section 3.5) suitable for BPZ. Magnitudes are corrected from galactic extinction using Schlegel, Finkbeiner & Davis (1998).

The best photometric redshift estimate for every source is z_b . Additionally, z_{b_min} and z_{b_max} represent the lower and upper limits for the first peak within a 1σ interval. Spectral-type classification is given by t_b where its number refers to the selected template as indicated in Fig. 4. Odds gives the amount of redshift probability enclosed around the main peak and Chi2 the reduced chi-squared

from the comparison between observed and predicted fluxes according to the selected template and redshift. Likewise, the cluster redshift in every field is also included (`clusterz`). An estimation of each detection stellar mass content (in units of $\log_{10}(M_{\odot})$) is given by `Stell_Mass`. Absolute magnitudes in the Johnson B band (`M_B`) are estimated for each detection according to its most likely redshift and spectral type from the `BPZ` code.

In order to properly estimate stellar masses and absolute magnitudes for the background galaxies, the catalogue contains an estimate of the expected magnification due to the gravitational lensing effect. These estimates (`mu_lens`) and its uncertainties (`dmu_lens`) are computed from the mass models derived by Zitrin et al. (2015) using the photometric apertures defined in Section 3.1 and a 1σ interval around the most likely redshift. A secondary estimation of both the stellar mass and the absolute magnitudes (`M_B_LensCor` and `Stell_Mass_LensCor`) is derived for all galaxies correcting for the expected magnification at that position. Finally, the catalogue includes a compilation of 1257 spectroscopic redshifts within the WFC3 FoV, indicating the exact values (`specz_value`), the references to the observational programme (`specz_refer`) and the corresponding quality flags (`specz_qual`).

This new photometric redshift catalogue along with additional value-added products (such as PSF models or redshift PDFs) can be reached from the MAST archive: <https://archive.stsci.edu/prepds/clash/>.

6 SUMMARY

In this paper, we have thoroughly discussed the complexity of deriving accurate colours for galaxies in dense environments and presented a new photometric pipeline for the CLASH survey capable of retrieving precise photometric redshift estimates for galaxies in massive galaxy clusters. The photo- z catalogue presented in this work represents (almost) a factor of 2 improvement in the photo- z quality with respect to the results presented in J14 (or up to a factor of 5 for galaxies with a magnitude $F814W < 20$). We have processed the entire CLASH data set with this new pipeline. This data set is composed of 16-filter *HST* imaging (0.2–1.7 μm) of 25 massive galaxy clusters of $0.1 < z < 0.9$.

Main differences with respect to our previous pipeline are (1) the definition of a new set of photometric apertures (`restricted` and `moderate`) to enhance the S/N of cluster galaxies in the bluest filters, (2) a PSF homogenization of images based on empirical PSF models, (3) an efficient subtraction of the ICL signal from images to restore the original colours of galaxies, (4) an empirical re-estimation of photometric uncertainties in images, (5) an improved definition of photometric upper limits fixing a previously unnoticed bias in the redshift distribution ($n(z)$) of background galaxies, (6) the extension of the `BPZ` library of templates to be able to reproduce the extreme colours of several cluster galaxies and (7) a recalibration of photometric uncertainties for very bright galaxies fixing another previously unnoticed bias affecting the photo- z quality of bright galaxies with high Odds.

We have computed and quantified the accuracy reached by our new photo- z pipeline. Based on a control sample of 382 cluster galaxies spread over the 25 clusters, these photo- z estimates reach a precision of $dz/(1+z) \sim 0.8$ per cent for galaxies with a magnitude $F814W < 18$, a $dz/(1+z) \sim 1.0$ per cent for galaxies with $F814W < 20$ or a $dz/(1+z) \sim 2.0$ per cent for galaxies with $F814W < 23$. According to the spectroscopic sample used in this work (see Section 4.2), the overall precision is $dz/(1+z) \sim 2.0$ per cent, negligible bias ($\mu = 0.004$) and a fraction of catastrophic outliers always below 3 per cent ex-

cept for the faintest magnitude bin ($23.5 < m < 24.5$) where the S/N of galaxies makes the photo- z estimations more uncertain. Finally, it is worth recalling that these numbers have been derived using a bright ($F814W$ 21.3) sample of spectroscopic galaxies. Therefore, its extrapolation to the faintest galaxies may be done with caution due to unwilling selection functions. As emphasized in this work, these results represent an overall factor of 2 improvement for the CLASH photo- z (or up to a factor of 4 for very bright galaxies) with respect to our results presented in J14. Meanwhile, this new photometry not only provides an overall higher precision at all magnitudes and redshift ranges, with respect to our previous pipeline, but also yields an expected dependence between the photo- z precision and the S/N of galaxies, not observed in our previous version. Therefore, the results presented in this work partially alleviate the previous tension between the expected performance for the CLASH photo- z reported in P12 and the results presented in J14.

As thoroughly discussed in Section 4.3, we have discovered a significant tension between the NIR colours predicted by the `BPZ` models and those observed in real data. For the reddest filter ($F160W$) and faintest galaxies, the observed magnitude offsets suggest that galaxies in the NIR are systematically (up to ~ 0.08) fainter than expected. When this effect is accounted for, the overall photo- z precision is dramatically improved.

We have run `BPZ2.0` on this new CLASH photometry to generate a new photometric redshift catalogue for the 25 CLASH massive galaxy clusters. The catalogue includes astrometric, morphologic, photometric and photometric redshift information along with an estimate of the demagnified stellar mass (`M_B_LensCor`) and absolute magnitudes (`Stell_Mass_LensCor`) for all detected sources in an NIR detection image (e.g. a weighted sum of WFC3/IR images: $F105W$, $F110W$, $F125W$, $F140W$, $F160W$). Based on this improved photometry and photo- z estimations, accurate redshift PDFs are derived and used to carry out membership analysis in all the 25 clusters. The analysis, presented in a separate paper (Molino et al., in preparation), finds > 3500 cluster member candidates down to a magnitude $M_B < -13$. This sample enables the characterization of the physical properties of the faintest cluster galaxies in the CLASH fields.

Finally, it is worth recalling that photo- z codes are very sensitive tools to the quality of the input photometry. In the era of large photometric redshift surveys, a special effort must be taken in the derivation of accurate and homogeneous photometric data sets. The analysis techniques developed here will be useful in other surveys of crowded fields, including the Frontier Fields, surveys carried out with *James Webb Space Telescope*, DES (Dark Energy Survey Collaboration 2016), *Euclid* (Refregier et al. 2010) or for the new generation of narrow-band photometric redshift surveys such as the Javalambre-Physics of the Accelerated Universe Astrophysical Survey (Benítez et al. 2014) aiming at measuring extremely precise ($dz/(1+z) \sim 0.3$ per cent) photometric redshifts on hundreds of thousands of galaxy clusters and groups (Ascaso et al. 2016).

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APPENDIX A

Table A1. The CLASH photometric redshift catalogues.

Column	Parameter	Description
1	CLASH_ID	CLASH object ID number
2	ClusterName	CLASH cluster name
3	RA	Right ascension in decimal degrees [J2000]
4	DEC	Declination in decimal degrees [J2000]
5	XX	<i>x</i> -pixel coordinate
6	YY	<i>y</i> -pixel coordinate
7	AREA	Isophotal aperture area (pixels)
8	FWHM	Full width at half-maximum (arcsec)
9	s2n	Signal-to-noise on (NIR) detection image
10	PhotoFlag	SExtractor photometric flag
11	nfo	Number of filters observed (out of 16)
12	nfd	Number of filters detected (out of 16)
13	PointS	Potential point source [0: extended, 1: candidate]
14	THETA	Position angle (CCW/ <i>x</i>)
15	a	Profile rms along major axis (pixels)
16	b	Profile rms along minor axis (pixels)
17	Backg	Background signal subtracted from detections
18	RK	Kron apertures in units of A or B (pixels)
19	RF	Fraction-of-light radii (pixels)
20	RP	Petrosian radii (pixels)
21	BCG_pos_RA	Right ascension for the BCG in decimal degrees [J2000]
22	BCG_pos_Dec	Declination for the BCG in decimal degrees [J2000]
23	PhyDistBCG	Projected physical distance to BCG (Mpc)
24	F225W_WFC3_PHOTOZ	<i>F</i> 225W/WFC3 ‘restricted’ magnitude (AB); best for photo- <i>z</i>
25	dF225W_WFC3_PHOTOZ	<i>F</i> 225W/WFC3 ‘restricted’ magnitude uncertainty (AB); best for photo- <i>z</i>
26	F225W_WFC3_MASS	<i>F</i> 225W/WFC3 ‘moderated’ magnitude (AB); best for stellar mass
27	dF225W_WFC3_MASS	<i>F</i> 225W/WFC3 ‘moderated’ magnitude uncertainty (AB); best for stellar mass
....		
40	F435W_ACS_PHOTOZ	<i>F</i> 435W/ACS ‘restricted’ magnitude (AB); best for photo- <i>z</i>
41	dF435W_ACS_PHOTOZ	<i>F</i> 435W/ACS ‘restricted’ magnitude uncertainty (AB); best for photo- <i>z</i>
42	F435W_ACS_MASS	<i>F</i> 435W/ACS ‘moderated’ magnitude (AB); best for stellar mass
43	dF435W_ACS_MASS	<i>F</i> 435W/ACS ‘moderated’ magnitude uncertainty (AB); best for stellar mass
....		
68	F105W_WFC3_PHOTOZ	<i>F</i> 105W/WFC3 ‘restricted’ magnitude (AB); best for photo- <i>z</i>
69	dF105W_WFC3_PHOTOZ	<i>F</i> 105W/WFC3 ‘restricted’ magnitude uncertainty (AB); best for photo- <i>z</i>
70	F105W_WFC3_MASS	<i>F</i> 105W/WFC3 ‘moderated’ magnitude (AB); best for stellar mass
71	dF105W_WFC3_MASS	<i>F</i> 105W/WFC3 ‘moderated’ magnitude uncertainty (AB); best for stellar mass
....		
88	clusterz	Cluster redshift
89	zb	BPZ most likely redshift
90	zb_min	Lower limit (95p confidence)
91	zb_max	Upper limit (95p confidence)
92	tb	BPZ most likely spectral type
93	Odds	$P(z)$ contained within $z_b \pm 2 \times 0.03(1+z)$
94	Chi2	Poorness of BPZ fit: observed versus model fluxes
95	M_B	Absolute magnitude in the B _J Johnson band [AB]
96	Stell_Mass	Stellar mass ($\log_{10}(M_{\odot})$)
97	F814W_ACS_MASS_LensCor	Lensing-corrected F814W_ACS_MASS magnitude
98	MB_LensCor	Lensing-corrected absolute magnitude [AB] (B _J Johnson)
99	Stell_Mass_LensCor	Lensing-corrected stellar mass ($\log_{10}(M_{\odot})$)
100	specz_value	Spectroscopic redshift [−99 if unknown]
101	specz_refer	Reference for the spectroscopic redshift
102	specz_qual	Quality of the spectroscopic redshift [0: secure, 1: likely, 2: unsure]

Table A2. CLASH photometric filter system. The table includes the filter effective wavelengths (λ_{eff}), the filter widths (FWHM), the averaged limiting magnitudes (m_{lim}) measured in 3 arcsec circular apertures and a 5σ significance and the averaged exposure time per filter.

Filter/ camera	λ_{eff} (Å)	FWHM (Å)	$\langle m_{\text{lim}}^{(3 \text{ arcsec})} \rangle$ (5σ)	(Time)
Ultraviolet				
F225W/WFC3	2414.5	67.7	26.4	3558
F275W/WFC3	2750.3	88.7	26.5	3653
F336W/WFC3	3381.2	203.6	26.6	2348
F390W/WFC3	3956.4	526.9	27.2	2350
Optical				
F435W/ACS	4365.2	203.3	27.2	1984
F475W/ACS	4842.5	318.7	27.6	1994
F606W/ACS	6104.6	809.9	27.6	1975
F625W/ACS	6374.6	546.0	27.2	2022
F775W/ACS	7755.2	603.0	27.0	2022
F814W/ACS	8454.5	2366.4	27.7	4103
F850LP/ACS	9140.7	388.4	27.7	4045
NIR				
F105W/WFC3	11 923.1	2818.5	27.3	2645
F110W/WFC3	12 249.8	4594.5	27.8	2415
F125W/WFC3	12 610.5	2844.4	27.2	2425
F140W/WFC3	14 153.4	4010.0	27.4	2342
F160W/WFC3	15 523.4	2855.5	27.5	4920

Table A3. Photometric zero-point offsets (I). The table includes the observed magnitude offsets and errors as much for three different families of objects (foreground, cluster and background galaxies) as for the total (Global) sample. Values are normalized to the ACS/F775W filter. The number of galaxies utilized in every bin (#) is indicated in the bottom part of the table.

Filter	Foreground	Cluster	Background	Global
F435W	-0.05 ± 0.09	-0.15 ± 0.14	-0.16 ± 0.14	-0.14 ± 0.13
F475W	-0.08 ± 0.05	-0.10 ± 0.08	-0.12 ± 0.09	-0.11 ± 0.08
F606W	-0.01 ± 0.04	0.02 ± 0.05	-0.03 ± 0.07	-0.01 ± 0.06
F625W	-0.01 ± 0.06	0.01 ± 0.05	-0.01 ± 0.10	0.00 ± 0.07
F775W	0.00 ± 0.04	0.00 ± 0.04	0.00 ± 0.08	0.00 ± 0.06
F814W	-0.01 ± 0.03	0.00 ± 0.04	-0.02 ± 0.07	-0.01 ± 0.05
F850LP	0.01 ± 0.04	-0.01 ± 0.03	-0.01 ± 0.08	-0.02 ± 0.05
F105W	-0.02 ± 0.02	-0.03 ± 0.02	-0.02 ± 0.05	-0.03 ± 0.03
F110W	-0.03 ± 0.03	-0.04 ± 0.02	-0.04 ± 0.04	-0.04 ± 0.03
F125W	-0.07 ± 0.02	-0.07 ± 0.01	-0.08 ± 0.03	-0.08 ± 0.02
F140W	-0.07 ± 0.01	-0.07 ± 0.01	-0.10 ± 0.02	-0.09 ± 0.01
F160W	-0.06 ± 0.02	-0.06 ± 0.02	-0.12 ± 0.03	-0.09 ± 0.02
Sample	99	561	635	1295

Table A4. Photometric zero-point offsets (II). Same as in the previous table but dividing the global sample into three different magnitude (F814W) bins.

Filter	$17 < m_{F814W} < 21$	$21 < m_{F814W} < 23$	$23 < m_{F814W} < 25$	Global
F435W	-0.08 ± 0.07	-0.09 ± 0.07	-0.12 ± 0.06	-0.14 ± 0.13
F475W	-0.06 ± 0.04	-0.07 ± 0.07	-0.11 ± 0.06	-0.11 ± 0.08
F606W	-0.01 ± 0.03	-0.02 ± 0.05	-0.02 ± 0.04	-0.01 ± 0.06
F625W	0.00 ± 0.03	-0.00 ± 0.05	-0.01 ± 0.06	-0.00 ± 0.07
F775W	0.00 ± 0.02	0.00 ± 0.04	0.00 ± 0.05	0.00 ± 0.06
F814W	0.01 ± 0.02	-0.01 ± 0.03	-0.02 ± 0.04	-0.01 ± 0.05
F850LP	0.01 ± 0.02	-0.02 ± 0.03	-0.02 ± 0.05	-0.02 ± 0.05
F105W	-0.01 ± 0.02	-0.03 ± 0.02	-0.02 ± 0.04	-0.03 ± 0.03
F110W	-0.02 ± 0.01	-0.05 ± 0.02	-0.05 ± 0.03	-0.04 ± 0.03
F125W	-0.04 ± 0.01	-0.08 ± 0.02	-0.10 ± 0.03	-0.08 ± 0.02
F140W	-0.03 ± 0.02	-0.09 ± 0.02	-0.12 ± 0.03	-0.09 ± 0.01
F160W	0.00 ± 0.03	-0.08 ± 0.03	-0.14 ± 0.05	-0.09 ± 0.02
Sample	207	337	351	1295

Table A5. Photometric zero-point offsets (III). Same as in previous tables but dividing the global sample into three different redshift bins.

Filter	$z_s < 0.3$	$0.3 < z_s < 0.5$	$z_s > 0.5$	Global
F435W	-0.04 ± 0.04	-0.07 ± 0.06	-0.09 ± 0.05	-0.14 ± 0.13
F475W	-0.04 ± 0.03	-0.07 ± 0.06	-0.08 ± 0.07	-0.11 ± 0.08
F606W	0.02 ± 0.02	0.01 ± 0.03	-0.02 ± 0.04	-0.01 ± 0.06
F625W	0.01 ± 0.02	0.01 ± 0.03	0.02 ± 0.06	0.00 ± 0.07
F775W	0.00 ± 0.02	0.00 ± 0.03	0.00 ± 0.04	0.00 ± 0.06
F814W	0.01 ± 0.02	-0.00 ± 0.02	0.00 ± 0.04	-0.01 ± 0.05
F850LP	0.01 ± 0.02	-0.01 ± 0.02	-0.01 ± 0.03	-0.02 ± 0.05
F105W	-0.00 ± 0.02	-0.02 ± 0.02	-0.02 ± 0.03	-0.03 ± 0.03
F110W	-0.01 ± 0.02	-0.04 ± 0.02	-0.04 ± 0.03	-0.04 ± 0.03
F125W	-0.03 ± 0.01	-0.06 ± 0.02	-0.08 ± 0.02	-0.08 ± 0.02
F140W	-0.00 ± 0.03	-0.07 ± 0.02	-0.10 ± 0.03	-0.09 ± 0.01
F160W	-0.00 ± 0.03	-0.04 ± 0.03	-0.10 ± 0.03	-0.09 ± 0.02
#	91	945	259	1295

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