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## ABSTRACT

The Reionization Cluster Survey imaged 41 galaxy clusters with the *Hubble Space Telescope* (*HST*), in order to detect lensed and high-redshift galaxies. Each cluster was imaged to about 26.5 AB mag in three optical and four near-infrared bands, taken in two distinct visits separated by varying time intervals. We make use of the multiple near-infrared epochs to search for transient sources in the cluster fields, with the primary motivation of building statistics for bright *caustic crossing events* in gravitational arcs. Over the whole sample, we do not find any significant ( $\gtrsim 5\sigma$ ) caustic crossing events, in line with expectations from semi-analytical calculations but in contrast to what may be *naively* expected from previous detections of some bright events or from deeper transient surveys that do find high rates of such events. Nevertheless, we find six prominent supernova (SN) candidates over the 41 fields: three of them were previously reported and three are new ones reported here for the first time. Out of the six candidates, four are likely core-collapse SNe – three in cluster galaxies, and among which only one was known before, and one slightly behind the cluster at  $z \sim 0.6$ – $0.7$ . The other two are likely Ia – both of them previously known, one probably in a cluster galaxy and one behind it at  $z \simeq 2$ . Our study supplies empirical bounds for the rate of caustic crossing events in galaxy cluster fields to typical *HST* magnitudes, and lays the groundwork for a future SN rate study.

**Key words:** transients: supernovae – galaxies: clusters: general – gravitational lensing: strong – stars: massive.

## 1 INTRODUCTION

Lensing of transient sources, whether theoretically or observationally, has risen in interest in recent years due to the ability to not only teach us about the lensed sources, but also constrain the dark matter composition of the lens (see Oguri 2019, for review). Among these transient sources, for example, are fast radio bursts (e.g. Muñoz et al. 2016), gamma-ray bursts (e.g. Paynter, Webster & Thrane 2021), supernovae (SNe; e.g. Kelly et al. 2015; Goobar et al. 2017; Rodney et al. 2021), gravitational waves (e.g. Dai et al. 2020; Broadhurst,

Diego & Smoot 2022), and caustic crossing events of lensed stars (e.g. Miralda-Escude 1991; Venumadhav, Dai & Miralda-Escudé 2017; Diego et al. 2018; Kelly et al. 2018; Meena et al. 2023b). Among the several transients described above, the most natural transients to look for in optical and near-infrared (NIR) imaging of galaxy clusters are lensed SNe and caustic crossing events.

Lensed SNe have been attracting much interest, in part since they are expected to be found to larger redshifts than non-magnified SNe, thus potentially improving the constraints on the cosmological parameters through their contribution to the Hubble diagram. Several SNe lensed by galaxy clusters have been found to date. The first few examples were found sufficiently far from the centre of the lens or at a low enough redshift behind it, so they were magnified

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but not multiply imaged. For example, Nordin et al. (2014) and Patel et al. (2014) found three lensed SNe in the 25 cluster fields of the *Cluster Lensing And Supernova survey with Hubble* (CLASH; Postman et al. 2012; see also Graur et al. 2014). Petrushevskaya et al. (2016) found five magnified SNe behind Abell 1689 up to redshift  $z \sim 1.7$ , and also searched for lensed SNe in multiply imaged galaxies in Abell 370 (Petrushevskaya et al. 2018). In another example, Rodney et al. (2015) found a Type Ia SN behind the *Hubble Frontier Fields* (HFF; Lotz et al. 2017) cluster Abell 2744, which was then confronted with magnification estimates from various lens models (see also Mahler et al. 2018). The past few years have also seen the first examples of several multiply imaged SNe, long anticipated (Refsdal 1964). *Refsdal*, the first multiply imaged SN, was detected by Kelly et al. (2015) as an Einstein cross around a cluster galaxy in the CLASH/HFF cluster MACS J1149.5+2223 (Ebeling et al. 2007). Another image of the SN appeared 1 yr later in a counter-image of the SN's host galaxy (Kelly et al. 2016), enabling a measurement of the expansion rate of the Universe from the time delays (Grillo et al. 2018; Vega-Ferrero et al. 2018). About 1 yr later, another lensed SN was found, multiply imaged by a field galaxy (Goobar et al. 2017). Rodney et al. (2021) have found another SN multiply imaged by a foreground massive cluster lens, MACS J0138.0–2155 (Ebeling et al. 2010), with the next image predicted to appear in about two decades. More recently, Chen et al. (2022a) found a multiply imaged SN around a galaxy in the HFF cluster Abell 370. At a redshift  $z \sim 3$ , this SN is the farthest one known, allowing also an early view of the SN's explosion thanks to the time delays. In addition to the physics they enable us to study, such multiply imaged transients are also important as they allow us to probe and recalibrate our lens modelling techniques (e.g. Treu et al. 2016; Zitrin 2021).

The rate of SNe in galaxy clusters has also spurred much interest (e.g. Gal-Yam et al. 2003; Graham et al. 2008; Mannucci et al. 2008; Dilday et al. 2010; Sharon et al. 2010; Sand et al. 2011; Maoz & Mannucci 2012; Maoz & Graur 2017; Freundlich & Maoz 2021). The process of chemical or metal enrichment by SNe is not very well constrained observationally (Sarkar et al. 2022). One of the crucial ingredients to characterize it is the distribution of delay time between a burst of star formation and the explosions as SNe, especially for Type Ia – for which the delay-time distribution spans Myr to Gyr time-scales (Maoz & Graur 2017), unlike core-collapse (CC) SNe, for example, which result from massive, short-lived stars. Because most galaxies in clusters are red elliptical galaxies, most SNe we expect to see in clusters are thus Type Ia, with a higher CC to Ia fractions towards higher redshifts around when the clusters formed ( $z \sim 3$ –4). That said, Graham et al. (2012), for example, found several CC SNe even in low-redshift cluster galaxies, showing that at least some low-level star formation is also taking place in these so-called red-and-dead galaxies. In addition, the progenitor of Type Ia SNe is not unambiguously known. In particular, it is not clear whether most Type Ia SNe result from single- or double-degenerate CO white dwarfs (e.g. Hillebrandt & Niemeyer 2000). Since different progenitor scenarios involve different time-scales that control the production rate of SN Ia events, the rate, and its dependence on the host stellar-population age, can help discriminate between these models (Maoz & Mannucci 2012). The rate of different types of SNe in cluster fields, as a function of redshift, is thus of high importance.

The detection of the first multiply imaged SN *Refsdal* (Kelly et al. 2015) also led to the serendipitous detection of another type of transient, namely a *caustic crossing event*. In follow-up observations of the SN, a new transient was seen atop the expected position of the lensing critical curve, where the magnification gets extremely high (Kelly et al. 2018). The spectral energy distribution (SED) and

properties of the transient matched well that of a star crossing the caustic, getting temporarily, extremely magnified (Miralda-Escude 1991; Diego et al. 2018). This event then opened the door to observing cosmological stars throughout the Universe. Indeed, a growing number of lensed stars have been observed since (e.g. Chen et al. 2019; Kurov et al. 2019; Diego et al. 2022; Kelly et al. 2022; Meena et al. 2023a), with the highest redshift example being Earendel at  $z \simeq 6.2$  (Welch et al. 2022a). *JWST* now offers a deeper window to observing and studying such stars through cosmic time, and has already revealed various types of stars in its first few months of operation (e.g. Chen et al. 2022b; Diego et al. 2023; Meena et al. 2023b; Pascale et al. 2022; Welch et al. 2022b).

In this work, we report the results from a search for transients in *Hubble Space Telescope* (*HST*) images taken for the Reionization Cluster Survey (RELICS) programme. In RELICS, 41 clusters were imaged in seven optical and NIR bands, to about 26.5 AB magnitudes per band. The four-band NIR imaging was repeated in two different epochs (see Section 2), separated by different periods of time (usually a few weeks or months), allowing us to search for transient sources. Our main motivation for the work is to estimate the rate of caustic crossing events in the survey. Although dedicated surveys with *HST* (e.g. the Flashlights programme; Kelly et al. 2022) and the first clusters imaged with *JWST* (see works mentioned earlier) imply relatively high rates to  $\sim 29$ –30 AB, the first lensed stars were discovered at a level of 26–27 AB magnitudes (Kelly et al. 2018; Chen et al. 2019; Kurov et al. 2019), suggesting that RELICS observations should be sufficient for detecting at least some bright caustic crossing events. The observed rate depends, however, on various observational and physical properties such as filter choice, the background stellar mass density, the source radius, luminosity, and mass functions, and properties of the lenses, which is why it is important to constrain.

The paper is organized as follows: We describe the data and observations in Section 2, and the methods in Section 3. The results are presented and discussed in Section 4, and the work is concluded in Section 5. Throughout, we use a standard flat Lambda cold dark matter cosmology with  $H_0 = 70 \text{ km s}^{-1} \text{ Mpc}^{-1}$ ,  $\Omega_\Lambda = 0.7$ , and  $\Omega_m = 0.3$ . All magnitudes quoted are in the AB system (Oke & Gunn 1983) and all quoted uncertainties represent  $1\sigma$  ranges unless stated otherwise.

## 2 OBSERVATIONS AND DATA

Throughout this work, we use data obtained in the framework of the RELICS programme. In this programme, 41 massive galaxy clusters were observed with the *HST* (PI: D. Coe), and the *Spitzer Space Telescope* (PI: M. Bradac), with the goal of detecting gravitationally lensed arcs, bright high-redshift galaxies (Salmon et al. 2020; Strait et al. 2021), and various transients [e.g. see the SNe listed in Coe et al. (2019) and the first spectacular detection of a lensed star at  $z \simeq 6.2$  in Welch et al. (2022a)]. All targets were observed to about 26.5 mag in seven *HST* bands: *F435W*, *F606W*, and *F814W* with the Advanced Camera for Surveys (ACS), and *F105W*, *F125W*, *F140W*, and *F160W*, with the Wide Field Camera Three (WFC3). The observations in all four NIR bands repeated in two different epochs, whereas the imaging in each optical band was taken in one of the two epochs. For some clusters, previous *HST* observations were used as well, as detailed in Coe et al. (2019).

The RELICS data products include reduced and colour images, photometric catalogues generated with SEXTRACTOR (Bertin & Arnouts 1996), and photometric redshifts computed with the Bayesian Photometric Redshifts tool (BPZ; Benítez

et al. 2004; Coe et al. 2006). These are publicly available on the RELICS website.<sup>1</sup> We refer the reader to Coe et al. (2019) for additional details on the *HST* data reduction and catalogue construction.

### 3 METHODS

#### 3.1 Image subtraction

Due to the fact that the final drizzled images of each epoch in each band are not part of the RELICS data products, we assemble an image for each epoch in each of the bands using the raw ‘.flt’ files. For each cluster, we use observations made with the WFC3 camera in four different bands (*F105W*, *F125W*, *F140W*, and *F160W*). For each epoch, all exposures of the same band are aligned using `TweakReg` and combined into a final image using `AstroDrizzle` (Koekemoer et al. 2011). Both functions are part of the DRIZZLEPAC software package available online. An automatic procedure is used to determine optimal values for the ‘conv\_width’ and ‘threshold’ parameters of the `TweakReg` function, minimizing the *rms* of the offsets in *x* and *y*. In several cases, the initial offsets of the data were large and hence we used the ‘search\_radius’ parameter for optimal alignment. We refer the reader to the DRIZZLEPAC documentation<sup>2</sup> for further details about these functions. The two final images are subtracted, resulting in a difference image in which transients are searched. We use once more the `AstroDrizzle` function to calculate the total errors for each epoch, and finally a signal-to-noise map is calculated.

Note that for each cluster and for each epoch, we also create a deeper ( $\sim 27$  AB) image by a weighted sum of the four WFC3/IR filters, and generate difference images from these ‘IR-combined’ images as well.

#### 3.2 Transient detection

We search for transients in the difference images by eye. The systematic search is initially done on the *F140W* difference image for all RELICS clusters. Using a simple script, each difference image (typically  $2 \text{ arcmin} \times 2 \text{ arcmin}$ ) is split into squares with an overlap of a few arcseconds between sub-frames. For each initial candidate identified, zoomed-in stamps in all available bands, including the IR-combined images, from both epochs and their difference images, are then generated for further inspection. Note that the search is done with a pixel scale of  $\sim 0.12$  arcsec. This pixel scale is comparable to the WFC3 NIR point spread function (PSF) and is nominally double both the RELICS pixel scale and the pixel scale we use here for photometry and measurement (see Section 3.3 below). This means that the search was made on, effectively, somewhat smoothed images, which can help in detecting some events.

We also perform another manual search on the deeper, IR-combined images using `SAOImageDS9`, especially around gravitationally lensed arcs, in a more focused attempt to detect caustic crossing events. In practice, we go over 47 arcs over all clusters (see Fig. 1 for examples). The mean photometric redshift (*z*) of the arcs is  $\sim 1.8$ , with a standard deviation of  $\sim 1.2$ .

The above searches are made on both the difference image and on its negative, to minimize biases related to white versus black

detections. For each cluster, we then perform a more detailed inspection of all candidates that survived the previous steps. We accept a candidate as a reliable transient if it appears in the difference images of all four NIR bands and in the relevant epoch in all available bands, and corresponds in practice to a signal-to-noise ratio higher than about  $\sim 5$ . This level was estimated by planting some point sources with different signal-to-noise ratios in some images, convolved with the PSF, and repeating the detection process. We also check whether the transient appears in RELICS colour images. In the scrutinizing process, the shape of the transient is also considered, as well as its location in the field; e.g. some events in the very edges were discarded as likely artefacts.

#### 3.3 Photometry measurements

We register our WFC3/IR images for the two epochs and the RELICS optical images to the *Gaia* Data Release 3 (Gaia Collaboration 2022) astrometry using `Scamp` (Bertin 2006) and resample the images with `Swarp` (Bertin 2010) on to the same  $0.06 \text{ arcsec/pix}$  grid as is used in RELICS. The photometry is measured on these images with the `PHOTUTILS` package (v1.5.0; Bradley et al. 2022) in a circular aperture, with a radius of  $\sim 3$  pixels of  $0.06 \text{ arcsec}$ , and corrected for local background flux measured in a circular annulus around the source. Exact apertures and background radii were slightly refined manually for each candidate, to minimize contamination by the host galaxy. We also run the same photometry on the difference images themselves. This constitutes an important consistency check as the difference in flux between the photometry of the first and second epochs should match the fluxes measured in the difference image. All photometry is summarized in Table 3. The images, including the difference images, as well as the photometry with relevant Julian date for each band, are made available online.<sup>3</sup>

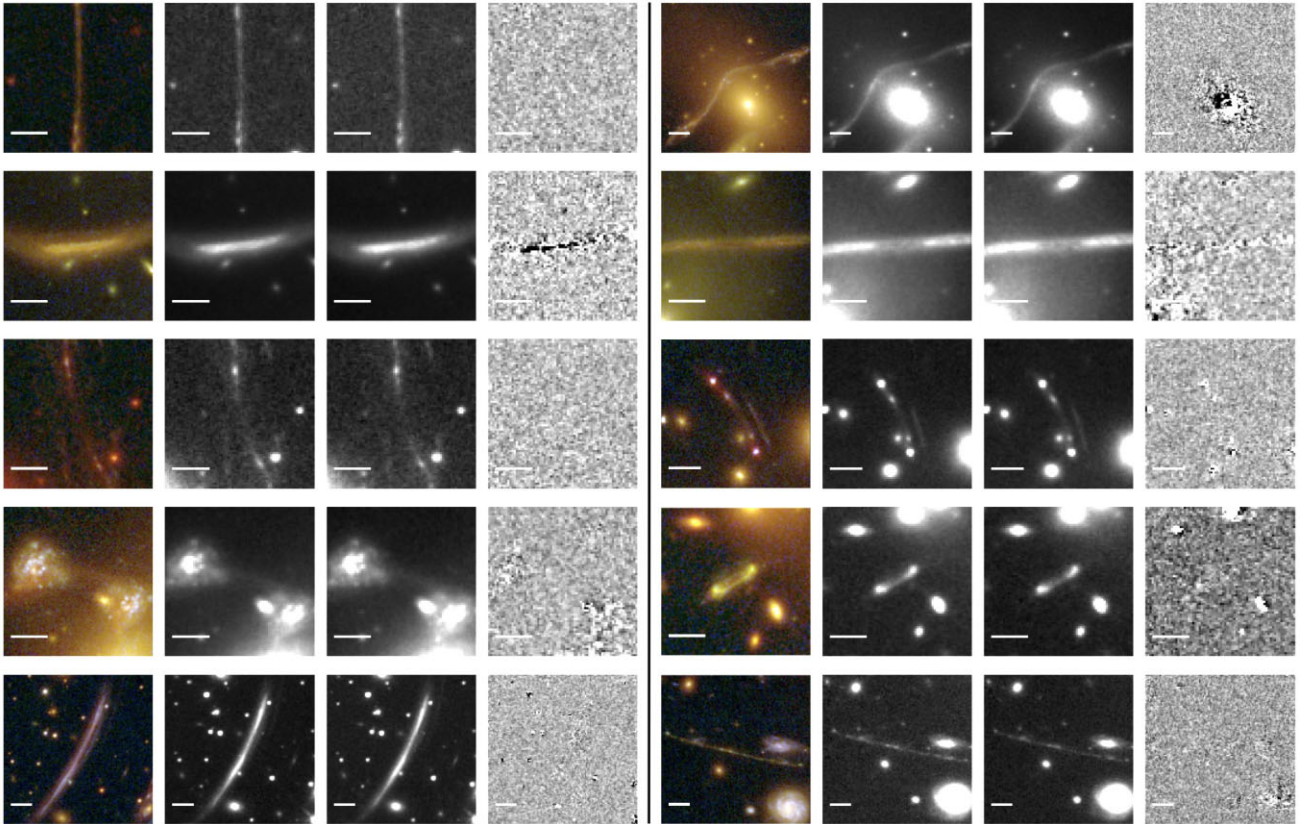
#### 3.4 Supernova light-curve fitting

We attempt to classify each of the SN candidates using the `STARDUST2` Bayesian light-curve classification tool (Rodney et al. 2014), which is built on the underlying `SNCosmo` framework and designed for classifying SNe using *HST*. `STARDUST2` uses the `SALT3-NIR` model to represent Type Ia SNe (Pierel et al. 2022) and a collection of 42 spectrophotometric time series templates to represent CC SNe (27 Type II and 15 Type Ib/c). These CCSN templates comprise all of the templates developed for the SN analysis software `SNANA` (Kessler et al. 2009), derived from the SN samples of the Sloan Digital Sky Survey (Frieman et al. 2008; Sako et al. 2008; D’Andrea et al. 2010), Supernova Legacy Survey (Astier et al. 2006), and Carnegie Supernova Project (Hamuy et al. 2006; Stritzinger et al. 2009; Morrell 2012), and extended to the NIR by Pierel et al. (2018). With `STARDUST2`, we use a nested sampling algorithm to measure likelihoods over the SN simulation parameter space, including priors on dust parameters described in Rodney et al. (2014). Nested sampling is a Monte Carlo method that traverses the likelihood space in a manner that samples the Bayesian likelihood (Skilling 2004). The results of the fitting and classification procedure are summarized by Table 2 and Fig. 2. We find two likely SNe Ia, one in a cluster member and one the previously discovered SN *Nebra* (see Table 1), two CC SNe with 75 and 84 per cent probabilities of being SNe Ib/c,

<sup>1</sup><https://relics.stsci.edu/>

<sup>2</sup><https://drizzlepac.readthedocs.io/en/latest/tweakreg.html>

<sup>3</sup><https://www.dropbox.com/scl/fo/5yfm78d1kwizy1h01gone/h?dl=0&rlk=ey=k00fqpuj4yynamatfq182117a>



**Figure 1.** Examples of caustic crossing arcs out of 47 arcs inspected in RELICS in which one may expect to observe lensed stars. For each example arc, we present, from left to right, a colour image, a combined image of all WFC3 bands for the first epoch, a similar image for the second epoch, and their difference image. The white bar in each image represents a scale of 2 arcsec. We find no clear detection of caustic crossing events in the RELICS survey. Left (from top to bottom): ACT-CL J0102–49151, A2813, ACT-CL J0102–49151, MACS J0417.5–1154, and PLCK G004.5–19.5. Right (from top to bottom): AS295, A2813, MACS J0035.4–2015, CL J0152.7–1357, and MACS J0553.4–3342.

**Table 1.** The six SN candidates found in this work. *Column 1:* Candidate ID, indicating also the abbreviated name of the cluster (see Section 4 for full cluster names); *columns 2 and 3:* RA and Dec. of the SN, in J2000.0; *column 4:* Cluster redshift as listed in Coe et al. (2019); *column 5:* Photo- $z$  from the RELICS catalogue for the most-probable host galaxy; *columns 6 and 7:* Dates of first and second epochs; *column 8:* Name of SN from Coe et al. (2019) and references therein. The three SNe for which no names are designated are the three newly found SNe.

Candidate ID	RA (J2000)	Dec. (J2000)	Cluster redshift	Host $z_{\text{phot}}^a$	First epoch	Second epoch	Name
RXCJ0142-SN1	25.740 828	44.641 610	0.341	3.53 [3.43–3.55]	2015-12-04	2016-01-14	–
AS295-SN1	41.392 7500	–53.030 8231	0.300	0.67 [0.53–0.72]	2016-08-30	2016-10-09	–
PLCKG171-SN1	48.246 4374	8.378 6862	0.270	2.71 [2.59–2.76]	2016-09-10	2016-10-21	Kukulkan
RXCJ0600-SN1	90.051 0314	–20.123 3171	0.460	0.38 [0.30–0.41]	2017-01-11	2017-02-15	William
A1763-SN1	203.813 0885	41.004 3610	0.228	1.75 [1.65–1.79]	2016-05-08	2016-06-17	Nebra
PLCKG287-SN1	177.716 2202	–28.093 2911	0.390	0.35 [0.30–0.37]	2017-02-21	2017-03-18	–

<sup>a</sup>Note that this is the host photo- $z$  as output by the RELICS pipeline. The final deduced type and redshift for each SN, as well as an indication whether it is in or behind the cluster, are given in Table 2 and Section 4.

and two likely SNeII. Of the CCSNe, all but one appear to be cluster members. These are further detailed in the results section (Section 4).

## 4 RESULTS AND DISCUSSION

In our transient search, we find no strong caustic crossing event candidates. This may be surprising at first sight, given that the first couple of lensed stars were detected to roughly similar magnitudes

as those reached by RELICS. However, as we show below in Section 4.1, this is in broad agreement with a rate expectation based on an order-of-magnitude calculation using some simple assumptions. We do find, however, six other prominent transients, likely SNe, detailed in Section 4.2.

### 4.1 Caustic crossing events

We now briefly estimate the expected rate of events one should detect to the depth reached by RELICS, over 41 cluster fields.

**Table 2.** Summary of the SN light-curve fits. *Column 1:* ID; *column 2:* Redshift of the cluster; *column 3:* Redshift range allowed in the light-curve fitting. In case the fit was performed using the cluster's redshift a single value is shown. *Column 4:* Best-fit redshift from the light-curve fit, in case a range was allowed; *column 5:* SN classification; *column 6:* Probability of each SN type; *column 7:* Time of peak (MJD); *column 8:* Reduced chi-square; *column 9:* Absolute B-band magnitude. For further details on the light-curve fitting procedure, see Section 3.4.

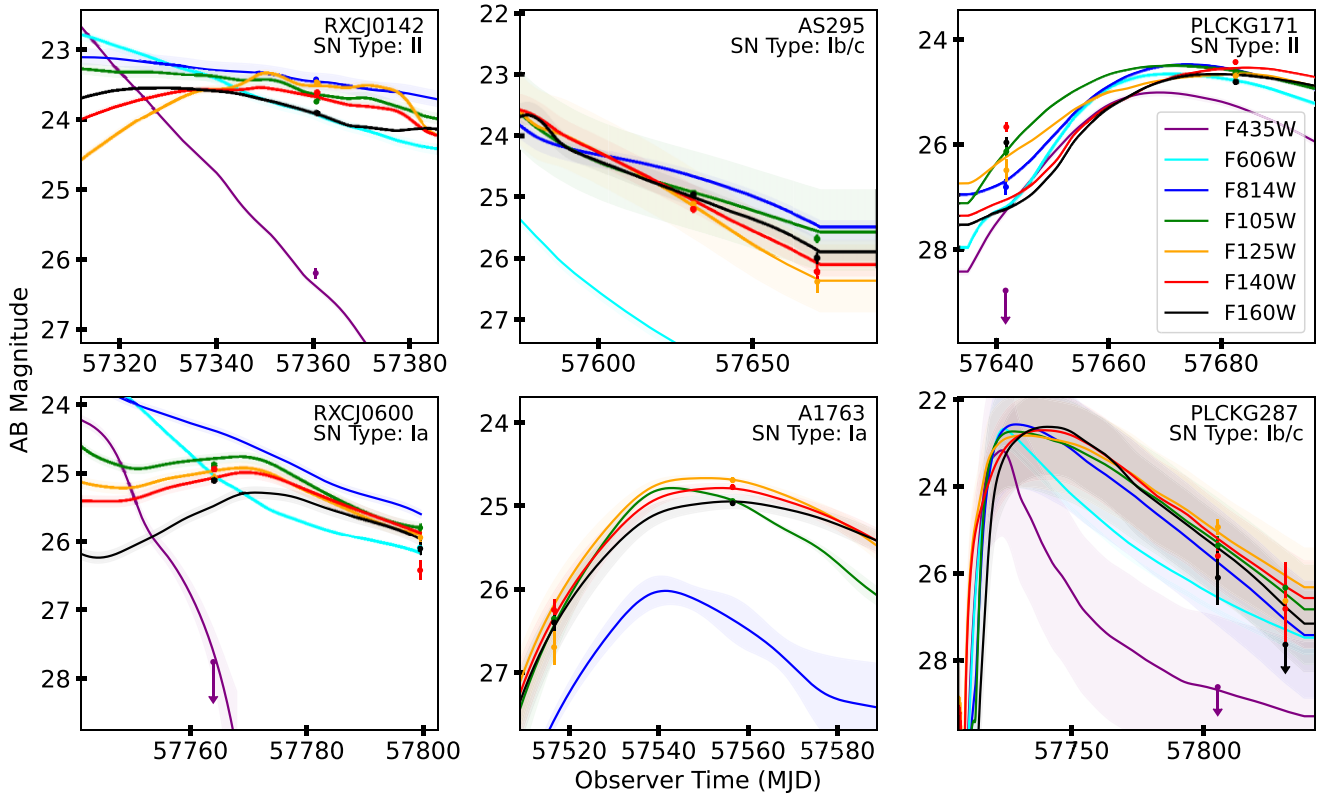
Candidate ID	Cluster $z$	$z$ bounds	Fitted $z$	Classification	Probability		Peak	Reduced chi-square	Absolute mag ( $B$ band)
					Ia–II–Ib/c				
RXCJ0142-SN1	0.341	0.341	–	II	0.0–1.0–0.0		57 305	11.2	–17.2
AS295-SN1	0.300	[0.53–0.72]	$0.64 \pm 0.02$	Ib/c	0.25–0.0–0.75		57 542	1.2	–18.4
PLCKG171-SN1	0.270	0.270	–	II	0.0–1.0–0.0		57 671	13.2	–16.0
RXCJ0600-SN1	0.460	0.460	–	Ia	1.0–0.0–0.0		57 727	9.6	–18.9
A1763-SN1	0.228	[1.65–2.0]	$1.96 \pm 0.04$	Ia	0.79–0.21–0.0		57 553	1.0	–20.1
PLCKG287-SN1	0.390	0.390	–	Ib/c	0.0–0.23–0.77		57 728	0.6	–18.3

**Table 3.** Aperture photometry for the six SN candidates found in this work and their host galaxies. For each SN, we list the photometry in both the first epoch and the second epoch, as well as the photometry on the difference images in the near-IR for consistency. For the host galaxy, we use the default (isophotal) photometry from the RELICS catalogues. In cases where the transient is not detected, we note a lower bound corresponding to  $1\sigma$  point-source AB magnitude limit.

AB magnitude in:	$F435W$	$F606W$	$F814W$	$F105W$	$F125W$	$F140W$	$F160W$
<b>RXCJ0142-SN1</b>							
Difference image	–	–	–	$24.42 \pm 0.02$	$24.20 \pm 0.03$	$24.29 \pm 0.03$	$24.91 \pm 0.03$
Epoch 1	$26.19 \pm 0.07$	–	$23.42 \pm 0.01$	$23.74 \pm 0.02$	$23.46 \pm 0.02$	$23.61 \pm 0.02$	$23.90 \pm 0.03$
Epoch 2	–	$24.76 \pm 0.02$	–	$24.39 \pm 0.04$	$24.25 \pm 0.04$	$24.48 \pm 0.06$	$24.40 \pm 0.04$
<b>RXCJ0142-SN1-Host</b>							
RELICS data	$23.34 \pm 0.03$	$22.23 \pm 0.01$	$21.63 \pm 0.01$	$21.63 \pm 0.01$	$21.63 \pm 0.01$	$21.56 \pm 0.02$	$21.50 \pm 0.01$
<b>AS295-SN1</b>							
2015 Jan. 23	>28.95	>29.35	>28.17	–	–	–	–
Difference image	–	–	–	$25.72 \pm 0.06$	$25.63 \pm 0.09$	$25.74 \pm 0.08$	$25.30 \pm 0.04$
Epoch 1	–	–	–	$24.94 \pm 0.04$	$25.12 \pm 0.06$	$25.20 \pm 0.06$	$24.97 \pm 0.04$
Epoch 2	–	–	–	$25.69 \pm 0.07$	$26.38 \pm 0.19$	$26.23 \pm 0.14$	$26.00 \pm 0.09$
<b>AS295-SN1-Host</b>							
RELICS data	$22.33 \pm 0.02$	$21.64 \pm 0.01$	$20.85 \pm 0.01$	$20.59 \pm 0.01$	$20.46 \pm 0.01$	$20.41 \pm 0.01$	$20.36 \pm 0.01$
<b>PLCKG171-SN1</b>							
Difference image	–	–	–	$24.94 \pm 0.04$	$24.81 \pm 0.06$	$24.84 \pm 0.05$	$25.23 \pm 0.06$
Epoch 1	$28.78 \pm 0.94$	–	$26.81 \pm 0.15$	$26.13 \pm 0.10$	$26.49 \pm 0.21$	$25.66 \pm 0.09$	$25.96 \pm 0.09$
Epoch 2	–	$24.77 \pm 0.02$	–	$24.63 \pm 0.03$	$24.69 \pm 0.05$	$24.42 \pm 0.04$	$24.81 \pm 0.04$
<b>PLCKG171-SN1-Host</b>							
RELICS data	$23.40 \pm 0.13$	$22.65 \pm 0.03$	$23.05 \pm 0.01$	$22.94 \pm 0.04$	$22.74 \pm 0.05$	$22.70 \pm 0.04$	$22.74 \pm 0.03$
<b>RXCJ0600-SN1</b>							
Difference image	–	–	–	$25.49 \pm 0.05$	$25.67 \pm 0.10$	$25.26 \pm 0.06$	$25.67 \pm 0.06$
Epoch 1	$27.76 \pm 0.26$	–	$26.93 \pm 0.12$	$24.89 \pm 0.03$	$25.08 \pm 0.06$	$24.95 \pm 0.04$	$25.11 \pm 0.04$
Epoch 2	–	$26.09 \pm 0.04$	–	$25.80 \pm 0.06$	$25.94 \pm 0.11$	$26.42 \pm 0.14$	$26.10 \pm 0.09$
<b>RXCJ0600-SN1-Host</b>							
RELICS data	$22.34 \pm 0.03$	$20.514 \pm 0.004$	$19.602 \pm 0.002$	$19.204 \pm 0.003$	$18.990 \pm 0.004$	$18.850 \pm 0.003$	$18.725 \pm 0.002$
<b>A1763-SN1</b>							
Difference image	–	–	–	$25.26 \pm 0.04$	$24.92 \pm 0.06$	$25.13 \pm 0.06$	$25.33 \pm 0.04$
Epoch 1	$26.78 \pm 0.15$	–	$27.38 \pm 0.19$	$26.35 \pm 0.09$	$26.70 \pm 0.21$	$26.25 \pm 0.12$	$26.40 \pm 0.09$
Epoch 2	–	$26.97 \pm 0.09$	–	$24.94 \pm 0.03$	$24.69 \pm 0.04$	$24.77 \pm 0.03$	$24.97 \pm 0.03$
<b>A1763-SN1-Host</b>							
RELICS data	$24.72 \pm 0.06$	$24.75 \pm 0.04$	$24.75 \pm 0.06$	$24.22 \pm 0.05$	$23.55 \pm 0.02$	$23.76 \pm 0.06$	$23.70 \pm 0.02$
<b>PLCKG287-SN1</b>							
2016 Aug. 3	–	>29.35	>27.99	–	–	–	–
Difference image	–	–	–	$25.96 \pm 0.11$	$25.22 \pm 0.07$	$25.98 \pm 0.12$	$26.50 \pm 0.13$
Epoch 1	$28.62 \pm 0.66$	–	–	$25.36 \pm 0.22$	$24.93 \pm 0.18$	$25.60 \pm 0.34$	$26.10 \pm 0.61$
Epoch 2	–	–	–	$26.33 \pm 0.45$	$26.63 \pm 0.84$	$26.82 \pm 1.07$	$27.64 \pm 2.56$
<b>PLCKG287-SN1-Host</b>							
RELICS data	$21.06 \pm 0.02$	$20.67 \pm 0.01$	$19.435 \pm 0.003$	$18.575 \pm 0.002$	$18.194 \pm 0.002$	$18.045 \pm 0.001$	$17.931 \pm 0.003$

To do this, we start by noting that caustic crossing events are biased towards bright and luminous stars. For an O/B-type star at redshift  $z = 2$ , with effective temperatures of  $T_{\text{eff}} = 12\,000\text{--}45\,000$  K, a magnification in the range of  $\sim 20\,000\text{--}50\,000$  is needed for

it to be visible at an apparent magnitude of 26.5–27.0 AB in the *HST* filters. In the corrugated network forming around the macro-critical curve, thanks to point masses in the lens such as stars etc., the typical peak magnification for a stellar source of radius  $R$  is



**Figure 2.** The best-fitting model for each SN light curve. Each colour corresponds to a different *HST* filter, with measurements shown as points with errors (or upper limit arrows) and maximum likelihood model realizations shown as solid lines. Shaded regions of the same colour correspond to  $1\sigma$  uncertainties from the fitting procedure. The SN type shown is the same as in Table 2, and corresponds to each plotted model.

expected to be (e.g. Venumadhav et al. 2017; Oguri et al. 2018)  $[10^4, 10^5] \times (R/10 R_\odot)^{-1/2}$ , with the exact value depending on the macro-convergence, microlens density, microlens mass function etc., with an average frequency of peaks of about  $\sim 1$  per year, per source star. For the above, we assume a typical stellar mass density of  $10 M_\odot \text{ pc}^{-2}$ . For a typical lensed arc, we adopt a typical apparent brightness of  $\sim 26 \text{ AB arcsec}^{-2}$ . This is equivalent to  $\sim 10^9 L_\odot \text{ arcsec}^{-2}$  for a source at  $z \sim 2$ , which roughly translates into  $\sim 1000$  massive stars per  $\text{arcsec}^2$ . For this order-of-magnitude calculation, we assume a Salpeter initial mass function ranging between  $0.1$  and  $100 M_\odot$ . Given most lensed arcs are typically blue star-forming galaxies, we neglect here the time evolution of the stellar population. It should, however, be acknowledged that the age, as well as other factors such as metallicity, may be important for assessing the true number of expected stars, and our calculation remains crude in that sense. In particular, a more evolved stellar population will include less massive stars, so our estimation is in that aspect an upper limit. The typical relevant area of the corrugated network in the image plane is  $0.1 \text{ arcsec}^2$ , equivalent to  $0.0005 \text{ arcsec}^2$  in the source plane, assuming a magnification of 200 within the corrugated network. Adopting a velocity of  $500 \text{ km s}^{-1}$ , this implies that we expect roughly one crossing every 2 yr in an arc.

Assuming that these events follow a Poissonian distribution, with an event lasting for  $\sim 3$  d, we can estimate the probability of detecting at least one event in a given arc, in one visit, to be  $\sim 0.4$  per cent. The probability of detecting at least one event over all the RELICS clusters, assuming one caustic crossing arc per cluster, is  $\sim 16$  per cent. Note that this is, in principle, an upper limit: stars in the corrugated network that are sufficiently close to the main caustic, such that they are constantly sufficiently highly magnified, will only

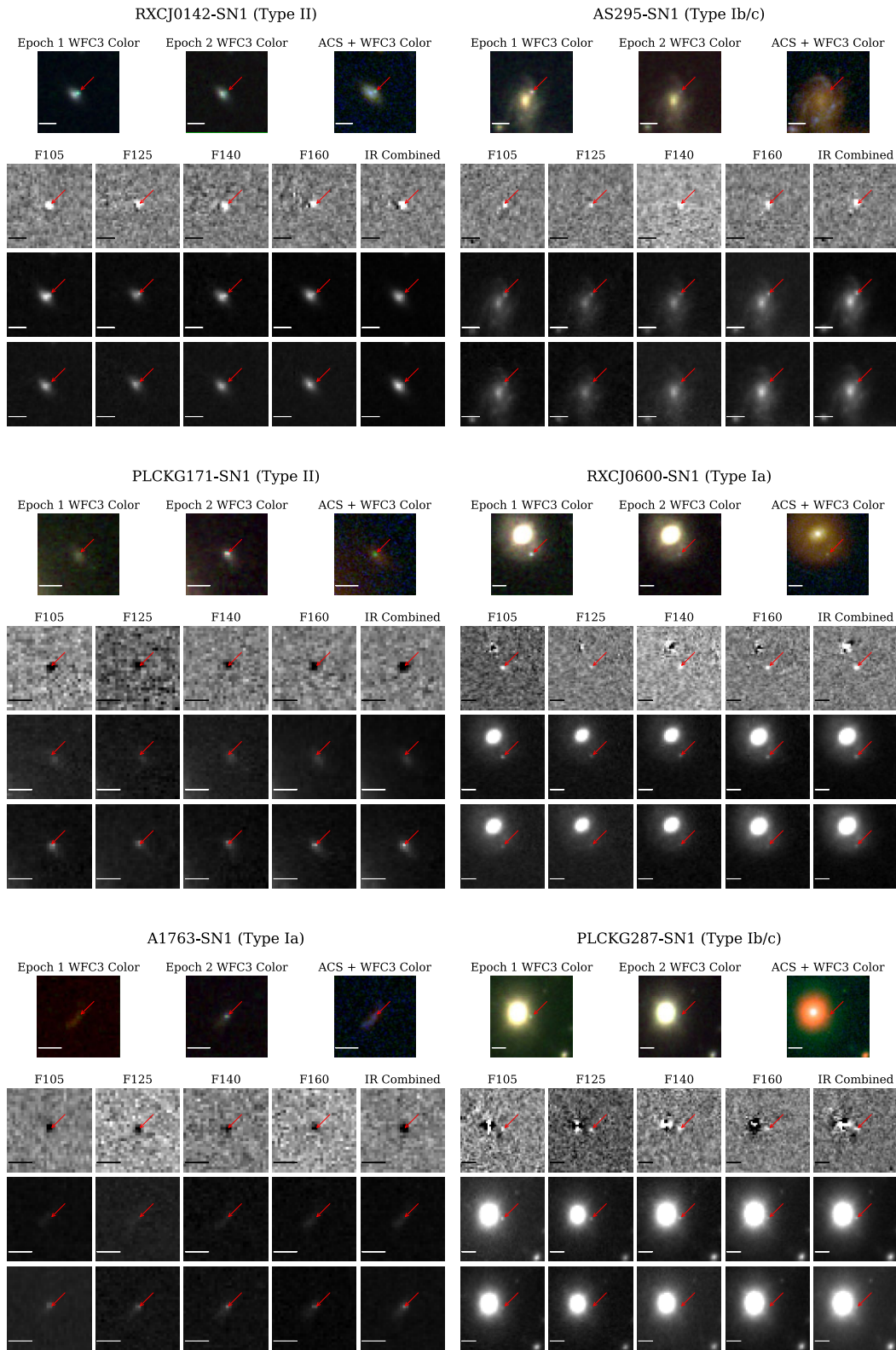
show minor fluctuations and will not be detected as transient sources in our difference images.

Outside the corrugated network, the magnification needed for O/B-type stars is typically too high to be reached in an individual microcaustic crossing. Still, such a magnification can be reached if several microlenses sit near each other so that we have overlapping microcaustics. Microlensing simulations (Meena, Arad & Zitrin 2022) show that the frequency of bright enough events in this regime is 1–2 orders of magnitude lower than on the corrugated network, hence contributing only little to the chances of seeing an event in RELICS.

Note, however, that some stars, such as various super- and hypergiants, may be intrinsically brighter than what we assume above, so they could be observed even with an almost order-of-magnitude lower magnification than considered here. One such example is Icarus, for which a peak magnification of  $\sim 3000$  was sufficient for its detection. This means that in practice, there may be somewhat more events expected than estimated above, although due to their low numbers (or the small area in which such magnifications can be reached), we do not expect a significant contribution from such stars.

#### 4.2 SN candidates

Our study yields six strong SN candidates summarized in Table 1. Three of the candidates were previously reported in Coe et al. (2019). We present the SN candidates in Fig. 3. Four of the transients are detected to be fading and two are getting brighter between the first and second epochs. The SN light-curve fits are summarized in Table 2 and shown in Fig. 2. While in principle SNe in galaxy



**Figure 3.** The six SN detections. For each one, at the top row we present three colour images, one for each epoch from the WFC3 filters, and one including all ACS + WFC3 filters; second row displays the difference image for each filter; next two rows present the images from the two epochs. A scale of 1 arcsec is marked upon the image. The red arrow in each stamp points to the exact candidate location. In parentheses, we designate for each SN candidate the best fitted type. The orientation of the figures is arbitrary.

clusters can appear in the diffuse intracluster light, all six SNe we find here seem to lie in potential host galaxies. We in addition use the Bayesian Analysis of Galaxy SEDs tool (BEAGLE; Chevillard & Charlot 2016) to infer the properties of the host galaxies based on their broad-band photometry presented in Table 3. Note that we assume the same redshifts for both the light-curve fitting of the SNe and the SED fitting of their host galaxies.

#### 4.2.1 RXCJ0142.9+4438

We detect a transient in the cluster RXC J0142.9+4438 ( $z = 0.341$ ; Fig. 3). The transient is detected to be fading between the first and second epochs. The apparent host has a photometric redshift of  $z_{\text{phot}} \approx 3.53$  in the RELICS catalogue. If this redshift is correct, this would make the SN the farthest one detected by *HST*. Indeed, the host galaxy does seem to be bluish-greenish in the RELICS colour image (Fig. 3), suggesting it is not a typical cluster member, but possibly behind the cluster. Our lens model implies that the galaxy would not be multiply imaged at that redshift, and indeed we do not identify any possible multiple images, so in that respect the high-redshift option remains potentially valid. The host galaxy, however, does not seem to be stretched tangentially, as would be expected by the lensing shear in this case, thus disfavouring the high-redshift solution. For a second redshift estimate, we also run an EAZY (Brammer, van Dokkum & Coppi 2008) photometric-redshift fit, using the RELICS photometry for the host. We obtain a lower redshift solution, similar to the cluster redshift, namely a best-fitting redshift and 68 per cent confidence interval of 0.34 [0.26–0.43], which would suggest that the host is in the cluster. The SN light-curve fit is thus run with the cluster’s redshift as input (see also Table 2). The photometry fits well a CC SN of Type II, with more than 90 per cent probability. While future spectroscopy of the host would be useful for securing its redshift, we conclude that it is likely a CC SN of Type II at the redshift of the cluster. The SN was not known before and reported here for the first time, to the best of our knowledge. As for the host galaxy, we find it is relatively massive with  $\log(M_*/M_\odot) = 9.50 \pm 0.02$ , relatively young with  $t_{\text{age}} \simeq 270$  Myr, and has a moderate star formation rate (SFR) of  $\log(\psi/M_\odot \text{ yr}^{-1}) = 0.3 \pm 0.2$ .

#### 4.2.2 Abell S295

In the cluster Abell S295 ( $z = 0.300$ ), we detect a transient fading between the first and second epochs. The transient appears to be inside a host galaxy (see Fig. 3) with a photometric redshift of  $z_{\text{phot}} \approx 0.67$ . A photometric-redshift EAZY fit yields a similar redshift of 0.67, with a narrow 68 per cent confidence interval of [0.61–0.71]. From the light-curve fit, in which the SN’s redshift is free to vary between  $\sim 0.5$  and  $\sim 0.7$ , we obtain it is likely (with 75 per cent probability) a CC of Type Ib/c, at an approximated redshift of  $0.64 \pm 0.02$ . The SN was not known before and reported here for the first time, to our knowledge. Our SED fit to the host galaxy suggests a massive ( $\log(M_*/M_\odot) = 10.4 \pm 0.1$ ), relatively young ( $t_{\text{age}} \simeq 160$  Myr), dusty ( $A_V = 3.3^{+0.4}_{-0.3}$ ), and heavily star-forming spiral with an SFR of  $\log(\psi/M_\odot \text{ yr}^{-1}) = 1.5 \pm 0.3$ .

#### 4.2.3 PLCK G171.9-40.7

The transient detected in PLCK G171.9-40.7 ( $z = 0.270$ ) gets brighter between the first and second epochs and appears to lie inside a very faint host galaxy, with  $z_{\text{phot}} \approx 2.71$  (see Fig. 3). Based on other multiple images known in this cluster (Cerny et al. 2018), we would expect the host to be multiply imaged, were it at  $z \sim 2$  or

above. However, we do not detect any counter image in the expected position based on the lensing symmetry, which suggests that the galaxy is probably at a lower redshift. Preliminary investigation of this candidate in Coe et al. (2019) classified the host as a cluster member galaxy. We run an EAZY photometric-redshift fit to the host photometry in the first epoch, where the SN’s contribution is negligible, and obtain a relatively wide range of possible redshifts, with a single-template best-fitting and 68 per cent confidence interval of 0.737 [0.05–2.11], leaving the redshift ambiguous. For this redshift, our lens model suggests a magnification of  $\mu \sim 2.3$ . Given the wide photometric redshift range, for simplicity we run the light-curve fit assuming the cluster’s redshift. The fit suggests that it is a CC SN of Type II, with over 90 per cent probability. For the host galaxy, we find a low stellar mass of  $\log(M_*/M_\odot) = 7.58^{+0.08}_{-0.07}$ , a very low SFR of  $\log(\psi/M_\odot \text{ yr}^{-1}) = -1.61 \pm 0.3$ , and a very young stellar age of  $t_{\text{age}} \simeq 13$  Myr. Note, however, that given the faintness of the object and the relatively large uncertainties on the photometry, BEAGLE does not find a very good fit at the cluster redshift assumed for the light-curve fit of the SN. In addition, since it is fitted at a very low redshift, this galaxy does not have any rest-frame UV photometry to properly constrain its current population of massive stars that produce CC SNe.

#### 4.2.4 RXC J0600.1-2007

The transient detected in the cluster RXC J0600.1-2007 ( $z = 0.460$ ) seems to be fading between the first and second epochs and appears to have exploded in the outskirts of a host galaxy (see Fig. 3) with a BPZ photometric redshift and 95 per cent confidence interval of 0.383 [0.30–0.41], not too far from the cluster’s redshift. This candidate has been previously reported in Coe et al. (2019), where it was mentioned that the host was probably a cluster member. We perform the light-curve fit using the cluster redshift as input and obtain that this is likely a Type Ia SN, with more than 90 per cent probability. The host galaxy is a massive [ $\log(M_*/M_\odot) = 10.96 \pm 0.02$ ], quiescent [ $\log(\psi/M_\odot \text{ yr}^{-1}) = 0.1^{+0.5}_{-1.3}$ ] cluster galaxy of  $t_{\text{age}} \simeq 960$  Myr.

#### 4.2.5 Abell 1763

We detect a transient in the cluster Abell 1763 ( $z = 0.228$ ), which seems to get brighter between the first and second epochs and appears to lie inside a very faint host galaxy ( $z_{\text{phot}} \approx 1.75$ ; see Fig. 3). This SN had been followed up with further observations, and was reported in some more detail in Rodney et al. (2016) and Coe et al. (2019) where it was classified as a lensed Type Ia SN at  $z \sim 2$ . Initial magnification estimate yielded  $\mu \sim 2$  (private communication). In this work, similar to all other cluster fields, we only use the first two epochs for our detection and analysis. Nevertheless, the light-curve fit, allowing a redshift range of [1.65–2] and based only on those two epochs, suggests a Type Ia SN at a redshift of  $z \simeq 2$ , with 80 per cent probability and in agreement with the previous analysis. We find the host galaxy has a relatively high stellar mass of  $\log(M_*/M_\odot) = 9.0 \pm 0.2$  and a low SFR  $\log(\psi/M_\odot \text{ yr}^{-1}) = -0.7^{+1.0}_{-0.9}$  and stellar age of  $t_{\text{age}} \simeq 120$  Myr.

#### 4.2.6 PLCK G287.0+32.9

We detect a transient in the cluster PLCK G287.0+32.9 ( $z = 0.390$ ). The transient appears to be fading between the first and second epochs and apparently lies in the halo of a cluster member host galaxy with  $z_{\text{phot}} = 0.35$  [0.30–0.37] (see Fig. 3). This candidate has not been previously reported, to our knowledge. We adopt the redshift of the



cluster for the light-curve fit and obtain that this is most likely a Type Ib/c CC SN (with over 75 per cent probability). In this case, the host galaxy is a very massive [ $\log(M_*/M_\odot) = 11.76 \pm 0.01$ ], quiescent [ $\log(\psi/M_\odot \text{ yr}^{-1}) = -1.1^{+0.7}_{-0.6}$ ], and old ( $t_{\text{age}} \simeq 10 \text{ Gyr}$ ) cluster member galaxy.

## 5 CONCLUSION

In this work, we present results from a search for transients in the 41 RELICS cluster fields. Motivated by the discovery of various caustic crossing events of lensed stars in imaging depths broadly similar to those obtained in RELICS (e.g. Kelly et al. 2018; Chen et al. 2019), and the rapidly increasing numbers of events detected in deeper observations (e.g. Kelly et al. 2022; Meena et al. 2023b; Pascale et al. 2022), our main goal was to characterize the caustic crossing event rate in lensed arcs in the RELICS survey.

We utilize the fact that the NIR imaging took place in two distinct epochs to create difference images for each cluster and search for transients. We do not detect any prominent caustic crossing event. We calculate the expected rate of events given the observational depth and find that the probability to detect at least one caustic crossing event in a cluster is  $\sim 0.04$  per cent per visit. Assuming one lensed arc per cluster, we finally conclude a probability of  $\sim 16$  per cent to detect at least one caustic crossing event in RELICS. Our study thus supplies an empirical limit on the rate of bright caustic crossing events, to typical *HST* magnitudes, suggesting that indeed, a depth of  $\sim 26.5 \text{ AB}$  is insufficient for detecting substantial numbers of lensed stars and that deeper observations are needed (as indeed successfully demonstrated in the references above).

Note that some lensed stars may also appear as quasi-persistent sources, in case they are sufficiently close to the caustic, in the so-called corrugated caustic network. One such famous example is Earendel, the farthest known lensed star detected at redshift  $z \simeq 6.2$  whose observed brightness has remained approximately constant over several years (Welch et al. 2022a), with only mild fluctuations. As another example, some types of stars such as Luminous Blue Variables can be bright enough for long periods of time at redshifts of  $z \gtrsim 1$ , even if farther away from the caustic. One such prominent example is *Godzilla* in the Sunrise Arc (Diego et al. 2022). Since these are not expected to appear as transient sources, we also search for possible point sources near to where the critical curves pass in lensed arcs. We find no additional, prominent point sources in caustic crossing arcs in RELICS, although we note also that this perhaps merits a further, designated examination.

While we do not find any lensed stars, our search yields six SN candidates. Three were previously known and reported in Coe et al. (2019), and three are, to the best of our knowledge, new ones presented here for the first time. Note also that Coe et al. (2019) found a few other candidates that are, however, mostly smaller or fainter looking than our candidates, and not retained in our search (such detection differences can be attributed to different image-subtraction and source-identification procedures). The SN candidates we find here are classified using the Bayesian light-curve fitting code STARDUST2, and we obtain that two of the six SNe are Type Ia candidates, and four are CC: two Type II candidates, and two candidates that are most probably Type Ib/c. Four of the SNe go off in the cluster, likely in cluster galaxies, where two seem to be lensed and lie behind the cluster, the farthest of them at  $z \simeq 2$ . In terms of type, three of the four SNe found inside the clusters are CC, and one is Ia. This ratio is perhaps a bit surprising given that the delay times from stellar formation to explosion are much longer for Ia than for CC, and that cluster galaxies are relatively early type, so-called red-

and-dead galaxies with very little new star formation. This may be partially explained by the fact that some of these SN host galaxies do not seem to be typical cluster members (i.e. red passive ellipticals). Additionally, the SZ-selected RELICS sample may be biased towards relatively massive, younger clusters in which galaxies possibly have some more star formation compared to the average cluster galaxy at similar redshifts. We run BEAGLE to extract the physical parameters of each host, and obtain that for three of the CC SN hosts the SFR is between a few and a few dozen  $M_\odot \text{ yr}^{-1}$ , although for the fourth it is very low ( $\sim 0.03 M_\odot \text{ yr}^{-1}$ ). For the two Ia SN hosts, the SFR is between  $\sim 0.1$  and  $\sim 3 M_\odot \text{ yr}^{-1}$ , i.e. on average lower than that for the CC hosts, as may be expected. Given the low number of SNe in our sample, however, we do not attempt to draw general conclusions regarding this ratio and the link to the host's properties.

The SN rate in galaxy clusters, particularly as a function of redshift and type, is of high importance for a variety of studies from characterizing the metal enrichment history in the cluster, through estimating the quenching and intracluster light (ICL) distribution time-scales (Maoz & Graur 2017), to shedding light on the SN progenitor problem (Maoz & Mannucci 2012). The detection of several SNe in this work thus calls for a rate calculation. In a follow-up work, we aim to estimate the completeness of SN detection in our method, extend the search to the parallel fields accompanying each RELICS cluster field, and calculate the resulting SN rate.

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This research made use of ASTROPY,<sup>4</sup> a community-developed core PYTHON package for astronomy (Astropy Collaboration 2013; Price-Whelan et al. 2018), as well as the packages NUMPY (van der Walt, Colbert & Varoquaux 2011), SCIPY (Virtanen et al. 2020), MATPLOTLIB (Hunter 2007), SPECUTILS (Earl et al. 2021), SPECTRAL-CUBE (Ginsburg et al. 2014), and some of the astronomy MATLAB packages (Ofek 2014).

## DATA AVAILABILITY

The data used in this work are publicly available on the Mikulski Archive for Space Telescopes (MAST) archive and the RELICS website.

<sup>4</sup><http://www.astropy.org>

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