An Exceptional Dimming Event for a Massive, Cool Supergiant in M51

Jacob E. Jencson1, David J. Sand1, Jennifer E. Andrews2, Jeniveve Pearson1, Stefano Valenti4, Emma R. Beason5,6, and Barry Rothberg6,7
1 Steward Observatory, University of Arizona, 933 North Cherry Avenue, Tucson, AZ 85721-0065, USA; jencson@email.arizona.edu
2 Gemini Observatory/NSF’s NOIRLab, 670 N. A’ohoku Place, Hilo, HI 96720, USA
3 Center for Data Intensive and Time Domain Astronomy, Department of Physics and Astronomy, Michigan State University, East Lansing, MI 48824, USA
4 Department of Physics and Astronomy, University of California, 1 Shields Avenue, Davis, CA 95616-5270, USA
5 NSF’s NOIR Lab, 950 N. Cherry Avenue, Tucson, AZ 85721, USA
6 LBT Observatory, University of Arizona, 933 N. Cherry Ave, Tucson, AZ 85721, USA
7 Department of Physics & Astronomy, MS 3F3, George Mason University, 4400 University Drive, Fairfax, VA 22030, USA

Received 2021 October 21; revised 2022 March 11; accepted 2022 March 24; published 2022 May 5

Abstract

We present the discovery of an exceptional dimming event in a cool supergiant star in the Local Volume spiral M51. The star, dubbed M51-DS1, was found as part of a Hubble Space Telescope (HST) search for failed supernovae (SNe). The supergiant, which is plausibly associated with a very young (≤6 Myr) stellar population, showed clear variability (amplitude \(\Delta F_{14W} \approx 0.7\) mag) in numerous HST images obtained between 1995 and 2016, before suddenly dimming by >2 mag in \(F_{14W}\) sometime between late 2017 and mid-2019. In follow-up data from 2021, the star rebrightened, ruling out a failed supernova. Prior to its near-disappearance, the star was luminous and red \((M_{F14W} \approx -7.6\) mag, \(F606W - F814W = 1.9 - 2.2\) mag). Modeling of the pre-dimming spectral energy distribution of the star favors a highly reddened, very luminous \((\log[L/L_\odot] = 5.4 - 5.7)\) star with \(T_{\text{eff}} \approx 3700 - 4700\) K, indicative of a cool yellow or post-red supergiant (RSG) with an initial mass of \(\approx 26 - 40\ M_\odot\). However, the local interstellar extinction and circumstellar extinction are uncertain, and could be lower: the near-IR colors are consistent with an RSG, which would be cooler \((T_{\text{eff}} \approx 3700\) K) and slightly less luminous \((\log[L/L_\odot] = 5.2 - 5.3)\), giving an inferred initial mass of \(\approx 19 - 22\ M_\odot\). In either case, the dimming may be explained by a rare episode of enhanced mass loss that temporarily obscures the star, potentially a more extreme counterpart to the 2019–2020 “Great Dimming” of Betelgeuse. Given the emerging evidence that massive evolved stars commonly exhibit variability that can mimic a disappearing star, our work highlights a substantial challenge in identifying true failed SNe.

Unified Astronomy Thesaurus concepts: Red supergiant stars (1375); Peculiar variable stars (1202); Stellar mass loss (1613); Evolved stars (481)

Supporting material: machine-readable table

1. Introduction

Massive stars (>8\(M_\odot\)) end their life in core collapse after nuclear burning is no longer sustainable. Often the collapse of a massive star results in the ejection of the stellar envelope and a luminous core-collapse supernova (SN), but this may not always be the case. Indeed, one surprising claim is that standard type IIP SNe, for which progenitor stars have been identified in deep pre-explosion data, arise from red supergiant (RSG) stars with only modest initial masses \(\lesssim 18\ M_\odot\) (e.g., Smartt et al. 2009; Smartt 2015), even though RSGs as a population extend to \(\gtrsim 25\ M_\odot\) (Humphreys & Davidson 1979). The apparent lack of high-mass RSG progenitors to type IIP SNe suggests that either they are systematically missed by transient surveys (e.g., they explode preferentially in heavily obscured regions) or that the highest-mass RSGs do not end their life as SNe. However, the value of the mass cutoff at \(\sim 18\ M_\odot\), its statistical validity, and its interpretation are controversial due to the complexities of connecting the limited observations to uncertain models (e.g., Davies et al. 2007; Smith et al. 2011; Walmswell & Eldridge 2012; Kocianek et al. 2012; Davies & Beason 2018, 2020a, 2020b; Kocianek 2020).

The putative lack of type II SN progenitors with initial masses \(\gtrsim 18\ M_\odot\) has led to the hypothesis that more massive stars cannot yield successful SN explosions, instead ending their lives as “failed” SNe that collapse directly into black holes (e.g., Kocianek et al. 2008), possibly with an associated fast, blue \((T_{\text{eff}} \lesssim 3700)\) and slightly less luminous \((\log[L/L_\odot] = 5.2 - 5.3)\), giving an inferred initial mass of \(\approx 19 - 22\ M_\odot\). In either case, the dimming may be explained by a rare episode of enhanced mass loss that temporarily obscures the star, potentially a more extreme counterpart to the 2019–2020 “Great Dimming” of Betelgeuse. Given the emerging evidence that massive evolved stars commonly exhibit variability that can mimic a disappearing star, our work highlights a substantial challenge in identifying true failed SNe.
the observed compact remnant population (Kochanek et al. 2014) and point to the stellar-mass progenitors of the black hole mergers observed by gravitational-wave experiments (Abbott et al. 2019; 2021). The ideal observational signature of a failed SN would manifest as a bright RSG star that winks out of existence (or nearly so) from one epoch to the next, and stays in that state permanently. With no accompanying luminous SN, the only explanation for the disappearance of such a massive star would be a direct collapse into a black hole, although some fading, optical/near-IR emission may remain from a weak envelope ejection or fallback accretion onto the newly formed black hole (Lovegrove & Woosley 2013; Perna et al. 2014).

Multiple projects have searched for disappearing massive stars. The first and most comprehensive of these has utilized the Large Binocular Telescope (LBT) to reimagine nearby galaxy fields (≤10 Mpc) with a cadence of ≈months over the last decade (Gerke et al. 2015; Adams et al. 2017a; Neustadt et al. 2021). This search has identified the best-known candidate for a failed SN, dubbed NG6946-BH1 (Adams et al. 2017b), which was an apparent \( \sim 25 \, M_\odot \) (≈\( 10^{5.5} \, L_\odot \)) RSG which brightened on a year timescale before nearly vanishing in the optical and IR. Follow-up observations show some fading remnant emission at the position, consistent with expectations of fallback accretion (Adams et al. 2017b; Basinger et al. 2021). The ongoing LBT survey has identified other potential failed SN candidates, including a blue supergiant star in M101 (Neustadt et al. 2021). A separate, multipoch archival Hubble Space Telescope (HST) search also identified a yellow supergiant (YSG) star that apparently vanished (Reynolds et al. 2015).

A primary challenge in identifying true failed SNe is that massive, evolved stars are subject to several forms of large-amplitude variability on essentially all timescales, some which may mimic a disappearing star at optical wavelengths. Eruptive variability, like that of the luminous blue variables (LBVs; e.g., Humphreys et al. 1999; Smith et al. 2001b; Smith 2017) or massive stellar mergers can form dust in their dense outflows, obscuring the surviving star in the optical, though producing bright mid-IR emission (e.g., Smith et al. 2016, 2018; Blagorodnova et al. 2017; Pejcha et al. 2016a, 2016b; see also IR-dominated transients in Jencson et al. 2019).

Massive, cool supergiants, subject to pulsational instabilities (Heger et al. 1997; Yoon & Cantiello 2010), manifesting as periodic or semiregular variations on timescales of months to years (e.g., Kiss et al. 2006; Yang & Jiang 2011, 2012; Soraisam et al. 2018), can also undergo episodes of enhanced mass loss accompanied by observed LBV-like color changes (Smith et al. 2004). These episodes may produce complex circumstellar material (CSM) like that observed for nearby, Galactic Y/RSGs that suggests prior, distinct mass ejections (e.g., Humphreys et al. 1997; Smith et al. 2001a; Smith 2004; Monnier et al. 2004). During such an event, increased opacity from a dense molecular wind (as in Mira variables, Reid & Goldston 2002; and for recent work on RSGs see, e.g., Davies & Plez 2021) or the formation of dust can obscure a star, causing a dramatic visual dimming. Such a scenario has, for example, been discussed at length to explain the recent historic minimum of Betelgeuse that occurred in 2019–2020, known as the “Great Dimming” (e.g., Levesque & Massey 2020; Montargès et al. 2021). Modern extragalactic transient searches are designed to find bright, explosive outbursts that can be seen at large distances. Dramatic fading events may also signify important instabilities in massive evolved stars; however, as with failed SNe, they are more challenging to find and our knowledge of their impact on stellar evolution is limited.

In this paper, we describe the first results from a program to search for failed SNe using a set of new HST data directed at nearby galaxies that have both a long history of archival HST imaging and have hosted multiple core-collapse SNe. We have identified a massive, cool supergiant star in M51 which underwent a significant dimming in 2019, preceded by a roughly year-long brightening phase, both of which pointed to a potential failed SN. As the first compelling candidate from our search, we named the object M51-DS1 (i.e., M51 “Dimming Star”) and began a dedicated follow-up campaign. Our subsequent HST and ground-based near-IR imaging showed that the star had rebrightened in 2021, ruling out a failed SN explanation for the dimming event. Nevertheless, we take a detailed look at the available data for the object as both a false-positive in our failed SN search and as a prime example of exceptional variability for a massive, evolved supergiant.

2. A New Hubble Space Telescope Search for Failed Supernovae

As described above, a clear observational signature of a failed SN is the permanent disappearance of a massive star. In order to observe more examples of the failed SN phenomenon, we chose nearby galaxies that are both proven core-collapse SN producers and have multiple epochs of HST imaging over the last ∼30 yr. To do this, we first identified galaxies that have hosted two or more core-collapse SNe in the modern era using the Asiago Supernova Catalogue (Barbon et al. 1999), supplemented by SNe found in the last several years using a query of the Transient Name Server.9 We cross-matched this list of galaxies with those that had two or more existing epochs of HST data in the F814W filter, and we reobserved the resulting 31 galaxies (all with \( D \lesssim 45 \, Mpc \)) over 41 orbits with the Advanced Camera for Surveys (ACS) in Cycle 26 (PI: D. Sand; PID: 15645), matching the footprint of previous HST imaging as best as possible. The F814W filter was chosen as our discovery filter because it is among the most sensitive to the supergiant progenitors to failed SNe, and has been commonly used throughout the HST’s lifetime with ACS, the Wide Field Planetary Camera 2 (WFPC2), and the Wide Field Camera 3 (WFC3); F814W is also less sensitive to extinction in regions of star formation than bluer bands. Each newly acquired F814W image is a full orbit with a standard subpixel dither sequence, and has a sufficient depth (F814W ≈ 27.2 mag with a signal-to-noise ratio, S/N, of ≈5) to observe massive stars with initial stellar masses \( \gtrsim 10 \, M_\odot \) throughout the distance range we cover, although some of the archival imaging we use is only sensitive to initial stellar masses \( \gtrsim 15 \, M_\odot \).

We identify massive star candidates that have vanished using difference imaging, subtracting older HST epochs with our newly acquired data. We outline the general procedure in Section 3 as we describe the identification of M51-DS1. Key to our strategy is the wide range of data available in both the HST and ground-based data archives for each of our target galaxies, which allows us to establish a baseline of existence for the progenitor star of any given failed SN candidate stretching back

9 https://www.wis-tns.org/
years prior to disappearance. We will provide further details about our strategy and expected number of failed SNe in a future work, as analysis is ongoing.

3. Observations and Data Processing

Here we describe the observations and data processing associated with the identification of M51-Ds1 as a failed SN candidate, along with subsequent follow-up observations.

3.1. HST Image Processing and Subtraction

To search for large-amplitude variables and “disappearing” luminous stars, we performed image subtraction with the available archival WFC3/UVIS and ACS/WFC images in the F814W filter that overlap with the footprint of our Cycle 26 program observations. For M51, this includes ACS/WFC frames taken from 2005 January 12–22 (PI: S. Beckwith; PID: 10452) and a large campaign consisting of 34 epochs taken between 2016 October 5 and 2017 February 17 to study massive star variability (PI: C. Conroy; PID: 14704; see Conroy et al. 2018, hereafter C18).

We used the Cycle 26 ACS/WFC F814W observations of M51 as template images for subtraction with each of the archival frames. These include two spatially overlapping visits taken on 2019 May 24 and 31, respectively, designed to maximize coverage of M51 and overlap with the archival images. Each visit consisted of four dithered 564 s exposures. We first downloaded the CALACS-calibrated and charge-transfer-efficiency (CTE)-corrected flc frames for both visits from the Mikulski Archive for Space Telescopes. We processed the images using the AstroDrizzle software package, including automated cosmic-ray rejection, subpixel alignments with TweakReg, and final combination into a single, drizzled mosaic at the native WFC pixel scale of 0.′′005 with an effective point-spread function (ePSF) of ≈2 pixels.

We then processed the available archival F814W frames from ACS/WFC in a similar manner. The 2005 observations consisted of a six-pointing, mosaicked mapping of M51, with each pointing composed of four dithered, individual 340 s exposures. We aligned each of the 24 individual frames to the drizzled Cycle 26 template mosaic using TweakReg, typically using between ≈300 and 4000 common stars depending on the size of the overlap region with the template. For the 2016–2017 data, each of the 34 epochs consists of four individual exposures totalling 2200 s. We again aligned each frame to the template using TweakReg, where the number of common stars used for alignment varied between ≈100–500 stars. We achieved (rms ≤ 0.1 WFC pixels in the x- and y-directions) for every frame. We then ran the aligned images through AstroDrizzle. For the purposes of image subtraction, we produced one large drizzled mosaic of the 2005 images and split the 2016–2017 into three batches consisting of observations taken between 2016 October—2017 January, 2017 February–May, and 2017 June–September. We used the 2019 template image as a reference in AstroDrizzle so that all the output images were drizzled onto the same pixel grid.

To prepare the drizzled images for subtraction, we ran each through the A-star packages Sextractor and PSFEx (Bertin & Arnouts 1996; Bertin 2011) to generate source catalogs and models of the point-spread function (PSF) for each image. The images and corresponding noise maps generated from the inverse-variance-map output of AstroDrizzle were then converted to units of electrons on the scale of the 2019 template using the zero-point and exposure time information in the image headers. The background level of the images were also estimated and removed using the minimum value from a median filter on a 15 × 15 grid of the region of overlap with the template.

We then performed image subtraction using the ZOGY algorithm (Zackay et al. 2016) on the background-subtracted images, with the noise maps and PSF model postage stamps as additional inputs. The subtraction produces a difference image, the difference image PSF, and a Scorr image (Equation (25) in Zackay et al. 2016), which is a match-filtered S/N image optimized for point-source detection. In order to use the Scorr image for the detection of variable objects, we normalize the Scorr values down to have a standard deviation of 1 over the image. This is necessary to account for the contribution of correlated pixel noise inherent in our drizzled images, which is not included in the calculation of the Scorr image with ZOGY. Finally, Sextractor is run on both the “positive” (archival-minus-template) and “negative” (template-minus-archival) difference images to build source catalogs of both fading and brightening objects. These are cross-matched with the corresponding, normalized Scorr image to select significant detections of S/N ≳ 5 (those objects with normalized Scorr values ≳ 5 in at least one pixel).

3.2. Candidate Identification

To select initial candidates, we require that a source be detected at |ΔλL| ≥ 10^7 L⊙ in the “positive” difference images from at least two archival F814W frames compared to the 2019 template, corresponding to an absolute magnitude in the difference image photometry of M_{F814W} ≲ −6.38 mag (Vega system) and indicating a luminous object that has faded significantly. This cutoff in the change in luminosity is the same as that used for the LBT search (Gerke et al. 2015; Adams et al. 2017a; Neustadt et al. 2021), which is sufficient to exclude lower-mass, large-amplitude variables including R CrB stars and Miras (M7 > −6 mag; Tisserand et al. 2009; Soysański et al. 2009). We also require that the two detections be separated in time by at least 1 month. This establishes an archival baseline for a given source as a persistent object, i.e., to reject real astrophysical transient events such as novae as well as chance cosmic-ray hits and other image processing and subtraction artifacts.

We then visually inspect the position of the object in all available F814W HST imaging to further reject any obvious image artifacts and examine the full history of the source in that band. A strong failed SN candidate will appear as a star-like source that is present in all archival frames of sufficient depth prior to its first significant fading, after which the source will not appear to rebrighten. We note that we do not require that a source actually completely “disappear,” because a possible companion or unrelated, nearby star in a crowded region may continue to be detectable at the location even after a true failed SN. Any source that passes this visual inspection will be assigned a “DS” name (short for “Dimming Star”) and flagged for detailed analysis, including PSF-fitting photometry of the available HST imaging in other filters (see Section 3.3.1 for details).

A subset of the sequence of available HST F814W imaging for M51-Ds1, our first compelling candidate (as defined by the criteria outlined above), is shown in the bottom row of panels
in Figure 1. The star was clearly detected in the 2005 and 2016 ACS/WFC images (also in 1995 and 2008 WFPC2 images, not shown). In the 2019 image obtained as part of our search the star has seemingly vanished and is clearly detected as a fading candidate in our difference images.

### 3.3. Archival Imaging, Follow-up Observations, and Photometry

Following our identification of M51-DS1 as a disappearing star and promising candidate for a failed SN, we began examining the wealth of multiband, archival HST imaging.
including the ACS/WFC F814W images described above and the complimentary F435W, F555W, and F658N (2005) and F606W (2016–2017) from the same programs. There is also coverage with WFC3/IR (0.′′13 pixels) in F110W and F128N (Paβ) taken on 2012 September 4 (PI: J. Koda; PID: 12490). As shown in Figure 1, M51-DS1 is notably red in appearance in the available archival imaging, and the optical source appears to be associated with a bright, relatively isolated star in the near-IR frames. As inputs to The Astrophysical Journal, we use only the 2012 observations in the redder F673N and F689M filters (PI: K. Kuntz; PID: 12762) where the star is clearly identifiable in the drizzled images. Similarly for WFPC2, while there are numerous prior observations in many filters that cover the location on the WF cameras, we consider only the F814W images from 1995 (PI: R. Kirshner; PID: 5777) and 2008 (PI: M. Meixner; PID: 11229) given the red color of the star and the increasing likelihood of contamination in bluer filters for the larger pixels of the WF chips (0.′′096).

We were also awarded an HST Cycle 28 mid-cycle proposal for additional deep, optical, and near-IR imaging of the field (PI: J. Jencson; PID: 16508) in order to verify the extreme fading of this source. The images for this program were obtained with ACS/WFC in F606W and F814W (total exposure time of 2208 s for each filter) on 2021 April 28–29 and with WFC3/IR in F110W and F160W on 2021 June 6 (1200 s exposure per filter). These new images revealed a surviving star at the location of M51-DS1 that had clearly rebrightened at F814W from the 2019 minimum (see the bottom-right corner of Figure 1). While this rules out a failed SN scenario for this object, the star is notably fainter at each of F606W, F814W, and F110W compared to the corresponding pre-disappearance imaging.

3.3.1. DOLPHOT Photometry

We processed the available HST imaging mentioned above with DOLPHOT (Dolphin 2000, 2016) to obtain PSF-fitting photometry of M51-DS1 and the surrounding stars in its vicinity. As inputs to DOLPHOT, we use the CTE-corrected flc frames for ACS/WFC and WFC3/UVIS observations, flt frames for WFC3/IR observations, and the standard-exposure-level cof and data-quality cif frames for WFPC2. Each input image was also run first through Astrodrizzle to flag cosmic-ray hits. We employ the parameter settings used for the HST PHAT survey (Dalcanton et al. 2012; Williams et al. 2014). These settings were also used by C18 to build their photometry catalogs of M51, to which we can directly compare our results.

For most of the data, we ran DOLPHOT separately for each instrument and filter combination over the available epochs, using the corresponding drizzled images as references for alignment. Generally, DOLPHOT produced excellent alignments better than ≈0.2 pixels rms for ACS/WFC and WFC3/UVIS, and ≈0.3 pixels rms for WFC3/IR and WFPC2. Owing to the large quantity of ACS/WFC F814W and F606W data (primarily from the C18 program), we had to run them in batches. In order to obtain consistent results across all runs for a given filter, we use the “warnstart” option in DOLPHOT, in which we use the output star catalog from an initial batch where M51-DS1 is well detected to fix the positions of stars in the subsequent runs for a given filter. DOLPHOT computes and applies aperture corrections to a radius of 0.′′5 for the reported photometry. We then applied the appropriate corrections to infinite apertures for each instrument and filter combination.10

To estimate the photometric uncertainties, we compute the rms deviations of the measurements for the individual frames that comprise a given HST observing visit of all stars within a 100 pixel radius of M51-DS1 as a function of magnitude, added in quadrature with the nominal statistical uncertainty reported by DOLPHOT.

For all the data that we ran, a “good” star (“object type” = 1) was detected by DOLPHOT at the location of M51-DS1 as measured in the 2016 F814W ACS frames within ≈0.5 ACS pixels, with the exception of the 2005 F435W and F555W ACS images. In these bluer filters, photometry of M51-DS1 is limited by crowding of nearby sources. We therefore adopt the magnitudes of the nearest detected star (1.3 and 0.8 pixels away for F435W and F555W, respectively) as limits. Our final DOLPHOT photometry is presented in Table 1. Throughout this work, all photometry is reported on the Vega magnitude system.

| UT Date       | MJD   | Inst.    | Band   | App. Magnitude (mag)       |
|--------------|-------|----------|--------|---------------------------|
| 1995 Jan 15.76 | 49732.76 | WFC2     | F814W  | 22.03 (0.20)              |
| 2005 Jan 21.36 | 53391.36 | ACS/WFC  | F435W  | >24.8                     |
| 2005 Jan 21.37 | 53391.37 | ACS/WFC  | F555W  | >25.1                     |
| 2005 Jan 21.38 | 53391.38 | ACS/WFC  | F814W  | 22.25 (0.11)              |
| 2008 Mar 31.14 | 54556.14 | WFC2     | F814W  | 22.79 (0.20)              |
| 2012 Sep 04.82 | 56174.82 | WFC3/IR  | F110W  | 20.09 (0.17)              |
| 2012 Sep 04.83 | 56174.83 | WFC3/IR  | F128N  | 19.54 (0.09)              |
| 2016 Oct 05.25 | 57666.25 | ACS/WFC  | F606W  | 24.51 (0.10)              |
| 2016 Oct 05.31 | 57666.31 | ACS/WFC  | F814W  | 22.44 (0.05)              |
| 2016 Oct 14.25 | 57675.25 | ACS/WFC  | F606W  | 24.54 (0.09)              |

Note. Table 1 will be published in its entirety in machine-readable format. A portion is shown here for guidance regarding its form and content.

* Vega magnitudes. $\sigma$ uncertainties are given in parentheses.

(These table is available in its entirety in machine-readable form.)

3.3.2. Ground-based Imaging and Photometry

We obtained follow-up imaging in the near-IR with the MMT and Magellan Infrared Spectrograph (MMIRS, 0.′′2 pixels; McLeod et al. 2012) on the 6.5 m MMT Observatory telescope on Mt. Hopkins at the Smithsonian’s Fred Lawrence Whipple Observatory. We obtained JHK imaging over a two-night run on UT 2021 February 23 and 24, consisting of

10 See Bohlin (2016) for ACS; for WFC3, see https://www.stsci.edu/hst/instrumentation/wfc3/data-analysis/photometric-calibration.
dithered sequences alternating between the target position in the central regions of M51 and an offset blank-sky field every few minutes to allow for accurate subtraction of the bright near-IR sky background. We reduced the images using a custom pipeline\textsuperscript{11} that performs standard dark-current subtraction, flat-fielding, sky background estimation and subtraction, astrometric alignments, and final stacking of the individual exposures.

We also obtained J- and K\textsubscript{s}-band imaging with the Near-Infrared Imager\textsuperscript{12} (NIRI) on the 8 m Gemini-N Telescope on Maunakea through a Directors Discretionary Time program (PI: J. Jencson; PID: GN-2021A-DD-101). The images were obtained with the f/6 camera (0\textquoteright 117 pixels) over multiple nights from 2021 April 1–6, again using sequences of dithered images alternating between the target position and an offset sky position. We also downloaded NIRI JHK images from the Gemini Observatory archive covering the location of M51-DS1 and taken in a similar manner with the same camera setup on 2005 June 27 (PI: S. Smartt; PID: GN-2005A-Q-49). We reduced all the images using DRAGONS,\textsuperscript{13} a Python-based platform for reducing Gemini data, and following the procedures for extended sources outlined in the NIRI imaging-reduction tutorial.\textsuperscript{14}

Lastly, near-IR K\textsubscript{s}-band observations were obtained on 2022 January 22 at the LBT Observatory. The LBT houses two 8.4 m mirrors on a single mount. Each mirror contains a nearly identical set of facility instruments. The observations were made using only the left (or SX) mirror and the LBT Utility Camera in the Infrared No. 1 (LUCI-1; Seifert et al. 2003). LUCI-1 contains a 2048 × 2048 pixel Teledyne HAWAII-2RG HgCdTe detector and was configured using the N3.75 camera, which yields a plate scale of 0\textquoteright 1178 pixel\textsuperscript{−1}. The observations were obtained using the Single conjugate adaptive Optics Upgrade for LBT (SOUL; Pinna et al. 2021), the second-generation adaptive optics (AO) system at LBT. The AO observations were made using Enhanced Seeing Mode (ESM). Unlike full AO, ESM only uses 11 modes of corrections and a frequency of 100–400 Hz (depending on the brightness of the reference star used to determine corrections), but is used in conjunction with the wider N3.75 FOV to achieve significant improvements over seeing-limited observations over a 4′ × 4′ FOV (see Rothberg et al. 2019, 2020). Observations were dithered, both on-target (to remove bad or hot pixels), and to blank sky to remove thermal contributions from the sky and the telescope/instrument. The data were reduced using standard IRAF procedures. The final flat-fielded and sky-subtracted individual frames were aligned and shifted using the IRAF tasks GEOMAP and GEOTRAN into a final mosaic of 40′03 × 4′4. The observations were taken under varying nonphotometric conditions. A set of stars or clusters were selected to track the flux changes for each of the exposures. An optimal image (based on the flux and FWHM of the PSF of the AO reference star) was selected and any exposures which decreased by more than 0.3 mags were rejected for the final combined image. The total exposure time for the LUCI-1 observations was 1174.68 s.

With the large field of view (FOV) of the MMIRS imager (6\textquoteright 9 × 6\textquoteright 9), we were able to calibrate the photometric zero-points using aperture photometry of relatively isolated stars in the MMIRS images with cataloged JHK\textsubscript{s}-band magnitudes in the Two Micron All Sky Survey (2MASS; Skrutskie et al. 2006). We then derived a model of the ePSF for each image by fitting bright, isolated stars using the EPSBuilder tool of the photutils package in Astropy. We performed PSF-fitting photometry at the location of M51-DS1 as well as for a set of approximately 60 stars spread across the images with varying degrees of crowding and galaxy-background emission. We include a low-order, two-dimensional polynomial in the fit to account for the spatially varying background for each star, taking care to avoid overfitting the data. We adopt the rms error of the fit residuals, scaled by a factor of the square root of the reduced χ\textsuperscript{2} (typically ≥1) for the fit, as the nominal statistical uncertainty per pixel, and multiply by the effective footprint, or number of “noise pixels,” of the ePSF\textsuperscript{15} to obtain an estimate of the statistical uncertainty for each flux measurement. We used the set of 2MASS calibration stars to derive aperture corrections (≤0.1 mag in all three filters) to place the PSF-fitting magnitudes on the scale of the image photometric zero-points. We adopt the statistical flux uncertainty, summed in quadrature with the rms error of the stars used in estimations of the zero-point and ePSF aperture correction, as the total uncertainty in our final magnitudes. Owing to the limited number of isolated 2MASS stars, even with the large FOV of MMIRS, the zero-point rms (typically ≈0.1 mag) dominates the error budget.

The FOVs of the NIRI (≈2′ × 2′) and LUCI-1 (4′ × 4′) images are smaller, and there were not enough isolated 2MASS stars in the central regions of M51 to do a direct calibration. We instead cross-calibrated our PSF photometry of stars in these images, performed in the same manner as described above, to a set of ≈15–20 common stars with the corresponding MMIRS image in the same filter. For our measurements of M51-DS1, we adopted the statistical uncertainty from the PSF-fitting (as above), summed in quadrature with the zero-point uncertainty (from the standard deviation of the individual stars used in the cross-calibration) as our measurement uncertainty.

The image quality of all the ground-based near-IR data was between ≈0\textquoteright 75 and 0\textquoteright 8 FWHM—a factor of ≈2–3 times that of WFC3/IR—generally with better seeing in the redder H and K bands. As noted in Section 3.3, M51-DS1 is relatively isolated in the near-IR, with the nearest comparably bright object in the WFC3/IR images at a separation of ≈1″. Still, our ground-based photometry may suffer some contamination from nearby unrelated sources, particularly in the J band. The 2005 and 2021 J-band fluxes are a bit higher than those from the comparable F110W images, though the discrepancies are ≤1.7σ. The 2021 H-band flux is fully consistent with the comparable F160W measurement, and we also expect any contamination to be small or negligible in the K band. Our final photometry of M51-DS1 from the ground-based near-IR images is provided in Table 2.

\textsuperscript{11} Adapted from the MMIRS imaging pipeline developed by K. Paterson, available here: https://github.com/CIERA-Transients/Imaging_pipelines.

\textsuperscript{12} http://www.gemini.edu/instrumentation/niri

\textsuperscript{13} https://dragons.readthedocs.io/en/v2.1.1/index.html

\textsuperscript{14} https://dragons.readthedocs.io/projects/niriimg-drtutorial/en/stable/

\textsuperscript{15} A derivation of this quantity is provided by F. Masci here: http://web.ipac.caltech.edu/staff/fmasci/home/mystats/noisepix_specs.pdf.
Table 2
Ground-based Near-IR Photometry

| UT Date   | MJD   | Tel./Inst. | Band | App. Magnitudea (mag) |
|-----------|-------|------------|------|----------------------|
| 2005 Jun 27.34 | 53548.34 | Gemini/NIRI | J   | 19.61 (0.14)         |
| 2005 Jun 27.36 | 53548.36 | Gemini/NIRI | H   | 19.14 (0.16)         |
| 2005 Jun 27.38 | 53548.38 | Gemini/NIRI | K   | 18.54 (0.21)         |
| 2021 Feb 23.36 | 59268.36 | MMT/MMIRS  | J   | 20.04 (0.11)         |
| 2021 Feb 23.49 | 59268.49 | MMT/MMIRS  | H   | 19.26 (0.09)         |
| 2021 Feb 24.40 | 59269.40 | MMT/MMIRS  | K   | 18.73 (0.13)         |
| 2021 Apr 01.45 | 59305.45 | Gemini/NIRI | J   | 20.04 (0.08)         |
| 2021 Apr 02.41 | 59306.41 | Gemini/NIRI | K   | 18.83 (0.12)         |
| 2022 Jun 22.48 | 59601.48 | LBT/LUCI-1  | K   | 18.69 (0.16)         |

Note.

a Vega magnitudes on the 2MASS system. 1σ uncertainties are given in parentheses.

4. Analysis of M51-DS1
4.1. Extinction, Distance, Host Galaxy Environment, and Metallicity

M51-DS1 is located at an R.A. and decl. of 13h29m56.16s, +47°11′47″.8 (J2000.0), near the inner regions of the nearby, star-forming galaxy M51. Throughout this work, we assume a distance modulus for M51 from McQuinn et al. (2016) of m − M = 29.67 ± 0.02 (statistical) ± 0.07 (systematic; Rizzi et al. 2007) mag (D = 8.58 Mpc) based on the luminosity of the tip of the red giant branch (TRGB) method, and that the systematic uncertainties associated with calibrating this method dominate over the statistical measurement uncertainties. We adopt the value from the NASA/IPAC Infrared Science Archive for the Galactic extinction toward the position of M51-DS1 of E(B − V) = 0.03 mag, based on the Schlafly & Finkbeiner (2011) recalibration of the Schlegel et al. (1998) dust maps, and assuming a standard (Fitzpatrick 1999) reddening law with R_V = 3.1.

The star is ≈36′′ from the galaxy nucleus along the outer edge of a densely populated spiral arm and prominent dust lane (see Figure 1). We thus expect the region may also be subject to substantial and spatially variable extinction from the host. Croxall et al. (2015) presented spectroscopic, gas-phase chemical abundances for 29 H II regions in M51 including extinction estimates derived from Balmer-line ratios as part of the CHemical Abundances of Spirals (CHAO) program. The two nearest H II regions to M51-DS1 from this study are labeled in Figure 1. One is centered on the dark dust lane with E(B − V) = 1.0 mag, while the other is along the inside edge of the spiral arm in a region that appears visually similar to that of M51-DS1 with E(B − V) = 0.4 mag. Wei et al. (2021) recently derived extinction maps of the M51 system from UV/optical and IR photometry, from which we again find M51-DS1 to be associated with a region of higher extinction with A_V ≈ 1.0–1.2 mag, or E(B − V) ≈ 0.3–0.4 mag for R_V = 3.1. These estimates are based on spatial averages in seeing-limited spectra (≈1″; for CHAO) or lower-resolution space-based imaging (e.g., ≈3′′ with Spitzer in Wei et al. 2021) and, while they are useful guideposts, the appearance of the dust lanes in the higher-resolution HST images indicates that there is likely substantial variation in the foreground host extinction on smaller spatial scales. In our analysis below, we therefore consider the implications of various amounts of additional reddening from dust in the interstellar medium of M51, ranging from E(B − V) = 0.0 mag to 1.6 mag.

From their set of H II regions, Croxall et al. (2015) found O/H abundances in the central regions of M51 to be approximately solar or somewhat supersolar (assuming solar abundances of 12 + log(O/H))_☉ = 8.69–8.78; Asplund et al. 2009; Ayres et al. 2013). Similarly, the metallicity map derived by Wei et al. (2021) suggests somewhat supersolar metallicities of log(Z/Z_☉) ≈ 0.0–0.3 dex in the vicinity of M51-DS1 along the inner spiral arm.

4.1.1. Membership in M51

Given its red optical colors (see Section 4.2 below), there is some possibility that M51-DS1 is a foreground cool dwarf in the Milky Way and not a true member of M51. We estimated the density of foreground cool dwarfs toward M51 using TRIdimensional model of the GaLaxy (TRILEGAL; Girardi et al. 2012), a simulator for stellar populations in the Milky Way. Based on our photometry catalogs (Section 3.3.1), there are four stars within 2′/4 of M51-DS1 (100 pc at the distance of M51) that have broadly similar properties, i.e., that are brighter than F814W ≤ 23.5 mag and with red colors F606W − F814W ≥ 2.0 mag. Comparing this to the density of stars with the same properties from TRILEGAL simulation, we find a chance probability of foreground contamination of about 0.04%. The density of foreground variables with these properties is likely much lower, and we note that M51-DS1 has no appreciable proper motion in HST imaging over 26 yr. Altogether, it is therefore very likely that M51-DS1 is a bona fide member of M51.

4.2. Optical/Near-IR Light Curves and Colors

The light curves of M51-DS1, dating back to 1995, are shown in Figure 2. The magnitudes displayed and discussed here have been corrected only for Galactic extinction. The star was detected dozens of times at F814W between 1995 and 2017, exhibiting some variability at the level of ≈0.7 mag between F814W = 22.74 ± 0.20 and 22.08 ± 0.06 mag (M_F814W = −6.9 to −7.6 mag). During 2016–2017, the evolution of the source was tracked at high cadence in both F814W and F606W with ACS/WFC (see inset in Figure 2). The source displays a smooth, slow rise in both bands at a relatively constant, red color between F606W − F814W = 1.6 and 1.9 mag, where the spread in the color measurements is comparable to their uncertainties.

Subsequently, the star underwent a dramatic fading in the 2019 ACS/WFC F814W observations, dropping to at least F814W > 24.2 (>−5.5 mag) in our DOLPHOT measurement, >2.2 mag below the brightest prior detection. Though DOLPHOT nominally obtained a detection (Section 3.3.1), the source looks to have nearly completely disappeared (Figure 2, bottom-center panel) at F814W, and, given the high degree of crowding at this location, we treat this measurement as an upper limit. Then, in our 2021 follow-up observations approximately two years later, the source has rebrightened partially to F814W = 22.97 ± 0.09 mag (−6.6 mag, similar to the prior F814W observed in 2008), and displays a slightly redder color at F606W − F814W = 1.97 ± 0.16 mag compared to the 2016–2019 measurements.

As expected given its red optical color, the source was brighter in the near-IR at F110W = 20.05 ± 0.17 mag

16 TRILEGAL simulations can be run with a webform, here: bhttp://stev.oapd.inaf.it/cgi-bin/trilegal.
(M_{F110W} = -9.6 mag) in the 2012 WFC3/IR image. In our recent 2021 HST follow-up imaging, around the time of the partial recovery seen in the optical, the star is also fainter at F110W = 20.44 ± 0.18 (M_{F110W} = -9.2 mag) with a red near-IR color of F110W - F160W = 1.0 ± 0.2 mag. The ground-based imaging with NIRI and MMIRS tells a similar story. In the 2005 NIRI imaging, the star is detected at J = 19.58 ± 0.14 (M_{J} = -10.1 mag), with J - K = 1.05 ± 0.25 mag. Subsequently, in our 2021 ground-based follow-up imaging, the star is again fainter in the near-IR filters with NIRI (MMIRS) compared to the pre-2019 levels at J = 20.01 ± 0.08 mag (20.01 ± 0.11 mag) and J - K = 1.20 ± 0.14 mag (1.29 ± 0.17 mag). In our most recent 2022 K_c-band image, the star remains at a similar brightness at K_s = 18.69 ± 0.16 mag (M_{K_s} = -11.0 mag).

4.2.1. Near-IR Photometric Classification and Bolometric Luminosity

At M_K = -11.1 mag (2005; Galactic-extinction correction only), the star is well above the TRGB, and, moreover, is brighter than any asymptotic giant branch (AGB) stars identified in nearby galaxies including the Large and Small Magellanic Clouds (L/SMC), M31, and M33 (see, e.g., Cioni et al. 2006; Boyer et al. 2011; Massey et al. 2021, and references therein). Its near-IR color of J - K_s ≈ 1.0–1.2 mag is also consistent with the range often used to identify RSGs, though it may be somewhat bluer given the likelihood of significant foreground host extinction (see Section 4.1). The K band is particularly useful as a luminosity indicator for RSGs, both because the effects of extinction are reduced compared to the optical and bluer near-IR bands, and because the bolometric correction, BC_K, is found empirically by Davies & Beasor (2018) to be constant across early-to-late M spectral types for cool supergiants in Milky Way and LMC star clusters. Thus, assuming an M-type spectrum (T_{eff} ≲ 3700 K) for M51-DS1 and adopting their value of BC_K = 3.0 mag, we obtain bolometric luminosities in the range log(L/L_⊙) ≈ 5.15–5.37 depending on the amount of extinction assumed in excess of the Milky Way foreground from E(B-V) = 0.0 up to 1.6 mag (the highest value found to produce good fits in our modeling of theSED in Section 4.4.1). The value for zero extinction, log(L/L_⊙) = 5.15, can likely be viewed as a robust lower limit, as any foreground extinction or an earlier intrinsic spectral type (<M0 with BC_K < 3.0), will both increase the inferred bolometric luminosity of the star. We discuss the possible location of the star in a Hertzsprung–Russell diagram (HRD) and inferred evolutionary state in comparison with the results of our SED fitting in Section 4.5.

4.3. Color–Magnitude Diagrams

In Figure 3, we present an F606W–F814W color–magnitude diagram (CMD) derived from our DOLPHOT photometry on the 2021 ACS/WFC images to place M51-DS1 in the context of the nearby stellar populations. Correcting only for Milky Way extinction, M51-DS1 appears as the most luminous red star (F606W – F814W ≳ 2 mag) at F814W within a projected distance of 100 pc (2.94) at its 2016–2017 level. It is one of only two stars within 50 pc that appears so red; the other is indicated by the magenta circle in both figure panels. Compared to the single-star, nonrotating, solar-metallicity stellar tracks from the Mesa Isochrones and Stellar Tracks models (MIST; Choi et al. 2016, 2017), its location in the CMD would correspond to an RSG with an initial mass ≈12–15 M_⊙ (2016–2017) or ≈8–10 M_⊙ (2021), with an age younger than ≈15 or 30 Myr, respectively. As noted in Section 4.1, however, there is likely to be significant and spatially variable foreground extinction in the region. For values of E(B-V) between 0.4 and 1.0 mag—in the range inferred from previous analysis of nearby H II regions by Croxall et al. (2015)—the position of the star would correspond to higher masses up to ≈20–25 M_⊙, and younger ages ≲7–10 Myr. Our analysis of the full SED of M51-DS1 in Section 4.4.1 suggests even higher extinction values of E(B-V) = 0.8–1.6 mag, possibly pointing to significant circumstellar extinction, corresponding to initial masses as high as ≈25–40 M_⊙ and implying an age as young as ≈5 Myr in the CMD.

As is evident from the tricolor image shown in Figure 3, the immediate region surrounding M51-DS1 is populated by a range of blue-, yellow-, and red-appearing stars. This is reflected as a notable spread in the F606W–F814W color between ≈0.3 and 1.6 mag for the bulk of the stars in the CMD within the 20 and 50 pc radii. If one assumes a coeval population of stars undergoing isolated evolution, this could be attributed to effects of foreground dust, possibly implying...
Figure 3. Left: immediate environment of M51-DS1 (red “x” symbol) in the 2005 ACS/WFC images (color-composite of F435W, F555W, and F814W, as in Figure 1) showing a mix of red and blue stars and dark regions that are likely obscured by dust. Radii corresponding to 20 (0.48) and 50 (1.2) pc projected distances from M51-DS1 are indicated. Sources indicated by multicolor symbols correspond to those objects marked in the CMD in the right panel. Right: the CMD of the region around M51-DS1 from the 2021 ACS/WFC F606W and F814W images. Stars within 20, 50, and 100 pc (projected; 0.48, 1.2, and 2.5 pc, respectively) from the location of M51-DS1 are shown as orange, blue, and gray points, respectively. Additional multicolor markers correspond to those objects indicated in the left panel. We also show single-star, solar-metallicity, nonrotating stellar evolutionary tracks from MIST as the black and gray dashed curves for a range of masses between 8 and 40 $M_{\odot}$. Measurements for M51-DS1 are shown as the large red stars, including four epochs during 2016–2017 and the 2021 measurement. The 2016–2017 points are also shown with varying degrees of foreground host extinction, $E(B-V)$, indicated by different colors as labeled. The nominal 2019 F814W DOLPHOT measurement (uncertainty) is indicated as the red horizontal line (shaded bar), though we consider this as an upper limit (see main text) as indicated by the downward arrow.

variable extinction in the range $E(B-V) \approx 0.0$–2.0 mag. Interpretation of the CMD as a whole, however, is complicated by additional factors on top of the uncertain extinction, including the possibility of multiple, overlapping stellar populations of different ages, and the effects of binary interaction—known to be increasingly common among more massive stars (e.g., Sana et al. 2012; Moe & Di Stefano 2017)—on the location of a given source in the diagram.

Despite these difficulties, we look briefly at a few individual sources that provide important context on the age of the population hosting M51-DS1 (as has been done for several SN progenitors; e.g., Van Dyk et al. 1999; Maund & Smartt 2005; Maund 2017). Within 50 pc, the apparently brightest object at F814W in the CMD, along with two somewhat fainter objects, are associated with what appears to be a partially resolved star cluster (indicated with cyan squares). They are thus not likely to be secure detections of individual stars and should be viewed skeptically in the CMD. After this, there are two bright, yellowish stars (indicated with yellow diamonds), at $M_{F814W} \approx -7.4$ mag and $F606W - F814W = 0.7$ mag, which, in the absence of additional foreground extinction, would correspond to stars of at least $\approx 12$–15 $M_{\odot}$ evolving across the Hertzsprung gap. Finally, within a smaller radius of 20 pc (0.48), the most luminous object after M51-DS1 is a blue (presumably unreddened) source at $F606W - F814W = -0.3$ mag (indicated in both the image and CMD by a blue circle). This would correspond to a $\approx 30 M_{\odot}$ star at the end of its main-sequence lifetime and implying an age $\approx 6$ Myr. This is consistent with the higher mass and younger age inferred for M51-DS1 above when one allows for significant foreground and/or circumstellar extinction ($E(B-V) \gtrsim 0.8$ mag), assuming it is part of the same coeval population, lending additional, contextual support to this interpretation.

4.3.1. Comparison to Luminous, Red, Large-amplitude Variable Stars

Regardless of the magnitude of the foreground extinction to M51-DS1, the track of possible locations it occupies in the CMD in Figure 3 essentially aligns with the red-end points of the MIST evolutionary tracks for stars of initial masses $\gtrsim 15 M_{\odot}$. RSGs in this region are expected to be susceptible to pulsational instabilities driven by partial ionization of hydrogen in their envelopes (e.g., Li & Gong 1994; Yoon & Cantiello 2010; and see region of “supergiant instabilities” in Figures 13 and 16 of C18).

To compare M51-DS1 to other such luminous, red variable stars, we selected stars from the catalog of light curves of luminous variables in M51 presented in C18. Of the more than $\approx 72,000$ objects in their catalog (including only the Milky Way extinction corrections already applied), we pulled out the 90 objects having $M_{F814W} \leq -7.0$ mag at any epoch (1995, 2005, and 2016–2017 data), average colors (including epochs within 0.5 mag of the F814W peak) of $F606W - F814W \geq 1.5$ mag, and maximum F814W amplitudes $\Delta F814W \geq 1.0$ mag. We examined both the images and light curves of these objects by eye to remove false positives such as foreground proper-motion stars and stars with large amplitude variability in the light curves that is not apparent in visual inspection of the images, likely indicating erroneous photometry. We also cull the sample by rejecting photometric points with large uncertainties ($\sigma_m > 0.2$ mag) and stars where the color evolution is dominated by light-curve scatter, usually in the fainter F606W measurements. We
thus select a clean sample of eight luminous, red, large-amplitude variables, and show their evolution in the CMD in Figure 4.

These eight stars can then be separated according to their color evolution: those that evolve to the red as they fade, those that remain at a relatively constant color, and those that evolve to the blue (shown as orange, yellow, and blue circles in Figure 4, respectively). The distinctions between these groups are seen more clearly in the differential CMD shown in the right panel of the figure, in which the average F814W magnitudes and F606W − F814W colors (using points within 0.5 mag of the F814W peak) have been subtracted out for each source. Interestingly, the “yellow”-class objects appear near the end of the RSG evolutionary tracks at the Hayashi limit (though we note that only foreground Milky Way extinction corrections have been applied), possibly indicating that their near-vertical evolution in the CMD may indeed be attributed to large-amplitude, radial pulsations that are theoretically expected for such stars. Between the 2016–2017 and 2021 data, the evolution of M51-DS1 appears most similar to this group. The 2019 dimming of M51-DS1 is exceptional as the largest amplitude variation seen among these luminous variables in M51. Unfortunately, we lack any information on its color evolution during the 2019 minimum.

The red-evolving objects notably become much redder than the end of the MIST tracks at F606W − F814W > 2.5 mag. The colors and large amplitudes of these stars may indicate they are very luminous AGB stars or Mira variables (e.g., Boyer et al. 2011; Yang et al. 2019; Neugent et al. 2020). At their peaks, they are brighter than any known AGB stars in the LMC (\(M_\text{V} \gtrsim 7\) mag; Soszyński et al. 2009), possibly pointing to extreme objects like super-AGBs—the proposed late-stage evolutionary phases of intermediate-mass stars in the range \(\approx 5–12 M_\odot\) (Doherty et al. 2017; O’Grady et al. 2020). The LMC may lack these rare, bright stars on account of its low mass compared to M51.

As shown in Figure 4, the color evolution of these stars is also strikingly similar to that of the Galactic RSG Betelgeuse from the American Association of Variable Star Observers (AAVSO) during its historic photometric minimum in 2019–2020, known as the “Great Dimming” (Guinan et al. 2019, 2020; Dupree et al. 2020). Multiepoch, high-resolution imaging revealed the appearance of an optically dark patch over part of the stellar surface during the dimming (Montargès et al. 2021). UV observations of chromospheric variability also indicate the formation of a dense, outflowing structure just before the event (Dupree et al. 2020), indicating an episode of enhanced mass loss. Using the method of TiO-band monitoring and tomography, Harper et al. (2020) and Kravchenko et al. (2021) have suggested an increased molecular opacity in the outflowing material as the primary cause of the dimming event. Levesque & Massey (2020), however, find that optical spectra during the dimming event do not show significant increases in the depths of molecular (e.g., TiO) absorption features, and argue instead for the formation of large-grain dust. Based on the similarity of their color evolution, it is possible that some of these objects represent similar or even more extreme instances of episodic, enhanced mass loss in cool supergiants, though we reserve a full analysis for future investigations.

We briefly comment on the two blue-evolving sources shown in Figure 4. Their evolution is reminiscent of that typical of bluer massive stars, namely the characteristic S Doradus variations between a hot (visibly fainter), quiescent state and a cool (visibly brighter), outburst state (e.g., Humphreys & Davidson 1994). Theoretically, massive stars in the bluer portion of the CMD are expected to be susceptible to instabilities arising in radiation-dominated envelopes that

Figure 4. Left: CMD of luminous (\(M_{\text{F814W}} \leq 7.0\) mag), red (F606W − F814W ≥ 1.5), high-amplitude (\(\Delta F814W \geq 1.0\) mag) variable stars in M51 from the catalog of C18 (small circles connected by dashed lines) compared to the 2016–2017, 2019, and 2021 data of M51-DS1 (red stars). The plotting colors of the catalog variable points correspond to their photometric color evolution during fading events: to the blue (blue), approximately constant (yellow), and to the red (dark orange). We also show the \(M_\text{V} − I\) evolution of Betelgeuse during its 2019 dimming event from the AAVSO, and the location of the progenitor of NGC 6946-BH1 from Adams et al. (2017b). As in Figure 3, we show single-star tracks of various masses from MIST. Right: differential CMD showing the same data as in the left panel, but with baseline colors and magnitudes subtracted out for each source as described in the text.

https://www.aavso.org/
approach the local Eddington limit (e.g., Paxton et al. 2013; Jiang et al. 2015; Owocki 2015; and see the “radiation-dominated instabilities” region in Figures 13 and 16 of C18). We suggest that the “blue”-evolving variables could be intrinsically bluer stars, possibly LBVs or YSGs experiencing LBV-like episodes (as in Smith et al. 2004), that are now reddened by the dust in the foreground ISM or formed in their own circumstellar environments during prior eruptive mass-loss events. A detailed examination of these objects is outside the scope of the present work.

Finally, having laid out the modes of variability observed (and expected) for luminous, red-appearing stars, we return to the variability of M51-DS1. As noted above, where color information is available for the 2016–2017 and 2021 epochs, M51-DS1 tracks with the mostly vertical evolution of the yellow-colored variables in Figure 4, consistent with expectations for pulsational instabilities occurring in massive ($\gtrsim 15 M_\odot$) RSGs, though large-grain circumstellar dust may also produce extinction that is relatively gray (see, e.g., Scicluna et al. 2015; Massey et al. 2006; Haubois et al. 2019). The long period of brightening seen between 2016–2017 may correspond at most to one-half of a full pulsation cycle, requiring that any periodicity be $\gtrsim 2$ yr in duration. Given the star’s high luminosity ($M_K = -11.1$ mag), this is consistent with expectations from the RSG period–luminosity relation observed in the Milky Way, L/SMC, M33, and M31 (Kiss et al. 2006; Yang & Jiang 2012; Soraisam et al. 2018). The maximum amplitude of this variability (excluding the 2019 minimum), is $\approx 0.9$ mag, only slightly larger than the pre-2019 variability observed at the level of $\Delta F814W \approx 0.7$ mag. At an exceptional $\Delta F814W \gtrsim 2.1$ mag, it is unlikely, though not strongly excluded, that the 2019 minimum is part of the inferred (semi)regular pulsation cycle ($\lesssim 10\%$ chance of finding the source in the bottom portion of a pulsation only once in the six light-curve samples over 26 yr). We therefore suggest that the 2019 dimming event of M51-DS1 represents a relatively rare occurrence, possibly an exceptional mass-loss event and more extreme cousin of the “Great Dimming” of Betelgeuse.

4.4. Spectral Energy Distribution Analysis

Figure 5 shows the multiepoch SEDs of M51-DS1, constructed from the available HST and ground-based photometry. The photometric magnitudes were converted to band luminosities, $L_\lambda$, using the zero-point fluxes and effective wavelengths available with the pysynphot package (STScI Development Team 2013) for the HST instrument and filter setups, and those compiled by the Spanish Virtual Observatory (SVO) Filter Profile Service\textsuperscript{18} for the ground-based observations (Rodrigo et al. 2012; Rodrigo & Solano 2020).

Prior to its dramatic dimming in 2019, the source was characterized by a very red SED peaking in the near-IR between 1 and 2 $\mu$m at $M_\lambda \approx 10^5 L_\odot$. The variability seen in the light curves (Section 4.2) is also reflected in the SEDs constructed from the 2005, 2012, and 2016–2017 data, though the overall color and shape of the SED remains largely constant. In 2019, the source faded by $\Delta M_\lambda \gtrsim 2.6 \times 10^4 L_\odot$ at F814W, a factor of $\gtrsim 7$ or $\gtrsim 85\%$ of the flux in that band. Without multiband observations in 2019, we are unable to constrain the shape of the SED or total drop in bolometric luminosity at that epoch. During our follow-up 2021 observations, the source has partially recovered in flux at F814W. The 2021 SED also peaks in the near-IR at $M_\lambda \approx 8.2 \times 10^4 L_\odot$ in F160W. While overall similar in color and shape, the source is dimmer across all the available optical and near-IR bands compared to the pre-2019 SEDs.

4.4.1. Spectral Energy Distribution Modelling

To estimate the physical parameters of the star, we attempted to fit the SEDs with the Grid of Red supergiant and Asymptotic Giant Branch Models (GRAMS; Sargent et al. 2011; Srinivasan et al. 2011). This suite of radiative transfer models consists of a base grid of 1225 spectra from spherically symmetric shells of varying amounts of silicate dust (Ossenkopf et al. 1992, appropriate for RSGs) around stars of constant density.
mass-loss rates computed using the dust radiative transfer code 2–Dust (Ueta & Meixner 2003). The published grid uses input PHOENIX model photospheres (Kučinskas et al. 2005, 2006) for $1 M_{\odot}$ stars (model spectra can be scaled for more luminous and massive, i.e., supergiant, stars) with effective temperatures, $T_{\text{eff}}$, between 2100 and 4700 K, and at a fixed subsolar metallicity $\log(Z/Z_{\odot}) = -0.5$ and a fixed surface gravity $\log g = -0.5$. The amount of circumstellar dust is characterized in terms of the optical depth at $1 \mu m$, $\tau_{1}$, from which a dust mass-loss rate, $\dot{M}_{d}$, can be inferred assuming a wind speed of $v_{w} = 10 \text{ km s}^{-1}$. An additional parameter in the GRAMS grid is the inner radius of the dust shell, $R_{m}$. We found that our results were largely insensitive to this parameter and we chose to fix it at $R_{m} = 11.0 R_{*}$, where $R_{*}$ is the stellar radius, to reduce the number of free parameters.

To model the source prior to its near-disappearance in 2019, we combined HST measurements from the 2017 ACS/WFC observations in F606W and F814W (MJD 58011) and the 2012 WFC3/UVIS observations in F673N and F689M (MJD 56020–56027) and IR observations in F110W and F128N (MJD 56174), together with the 2005 ground-based NIRI measurements in $J$, $H$, and $K$ (MJD 53548). Given the observed variability of the source during this time period, we experimented with fitting different combinations of the available pre-2019 data, but found that these epochs together gave the best results. We also included additional reddening (extinction law of Fitzpatrick 1999 with $R_{V} = 3.1$) for a range of $E(B-V)$ values between 0.0 and 3.0 mag to account for the likely significant and uncertain host extinction (see Section 4.1). We then fit each (reddenred model spectrum in the expanded grid (99,225 models in total) by computing $\chi^{2}$ values between the data points and synthetic photometry on the spectra, weighted by data-point uncertainties and allowing for an overall scaling factor of the flux as a free parameter. In our analysis, we will consider “good” models as those with $\chi^{2} \leq \chi^{2}_{\text{min}} + 2 \Delta \chi^{2}_{90}$, where $\chi^{2}_{\text{min}}$ is the minimum value of $\chi^{2}$ found for all the models, and $\Delta \chi^{2}_{90}$ is the 90%-tile of the $\chi^{2}$ distribution with degrees of freedom $\nu$.

The results of this fitting procedure for the pre-2019 SED are shown in the center panel of Figure 5. The best-fitting model ($\chi^{2}/\nu = 3.12$) has $T_{\text{eff}} = 4300$, $E(B-V) = 1.28$, and log$(L/L_{\odot}) = 5.60$. With $\nu = 5$ degrees of freedom, $\Delta \chi^{2} = 9.24$, and we find a set of 257 good models with $T_{\text{eff}} = 3700–4700 \text{ K}$, $E(B-V) = 0.56$–1.56 mag, and log$(L/L_{\odot}) = 5.35$–5.75. Unsurprisingly, $T_{\text{eff}}$ and $E(B-V)$ are strongly positively correlated for the set of good models, and we note that the range of $T_{\text{eff}}$ they span extends to the maximum value in the grid. The $\chi^{2}$ distribution is well behaved around the minimum at $T_{\text{eff}} = 4300 \text{ K}$ in the range we tested, although highly reddened, warmer models could, in principle, also provide acceptable fits to the SED. These results point to a very luminous, cool ($\approx K$ or early M spectral type) supergiant star, near the empirical Humphreys–Davidson limit (log$(L/L_{\odot}) = 5.5$–5.8; Humphreys & Davidson 1979; Davies et al. 2018). In comparison to single-star evolutionary tracks from the MIST models (Choi et al. 2016, 2017), this would correspond to a star with an initial mass $\approx 24–40 M_{\odot}$ with terminal age $\lesssim 8 \text{ Myr}$ (see Figure 6 and further discussion in Section 4.5).

We fit the post-fading SED, constructed from the 2021 ACS/WFC (F606W, F814W), WFC3/IR (F110W, F160W), and MMIRS ($J$, $H$, $K_{s}$) imaging, using the same procedure and show the results in the rightmost panel of Figure 5. In this case, the best-fitting model ($\chi^{2}/\nu = 4.78$) has $T_{\text{eff}} = 4300$, $E(B-V) = 1.64$, and log$(L/L_{\odot}) = 5.52$. The set of 125 good models ($\nu = 3; \Delta \chi^{2}_{90} = 6.25$) now has $T_{\text{eff}} = 3900–4700 \text{ K}$, $E(B-V) = 1.0$–1.9 mag, and log$(L/L_{\odot}) = 5.31$–5.65. Overall, results for the 2021 SED suggest a slightly dimmer star than the pre-fading data, though there is substantial overlap in the allowed parameter ranges.

While the GRAMS grid includes models with high values of circumstellar extinction up to $\tau_{1} \approx 60$, our fitting results for both the pre- and post-fading data favor $\tau_{1} \lesssim 0.9$ and corresponding to dust mass-loss rates below $\dot{M}_{d} \lesssim 10^{-7} M_{\odot}$ yr$^{-1}$. This is in accord with modern estimates of mass-loss rates for normal RSG winds in this luminosity range (Beasor et al. 2020). At the same time, the models favor relatively high values of foreground host (i.e., ISM-like) extinction. Importantly, longer-wavelength data ($\gtrsim 3–5 \mu m$, and especially at the 10 $\mu m$ silicate feature) that are sensitive to emission from warm dust would be required to directly constrain the amount of CSM, so our ability to distinguish circum- and interstellar extinction should be viewed cautiously. Notably too, the modeling results for the 2021 data favor higher values of the foreground extinction to account for the redder colors of the source compared to the pre-fading source. An increase in the amount of intervening ISM material is presumably unphysical, indicating that other effects not captured by the models may be at play in the observed SED evolution. These may include the effects of increased molecular opacity during episodes of enhanced mass loss (see, e.g., Davies & Plez 2021),
changes in composition or the grain-size distribution of circumstellar dust, and/or the effects of nonspherical geometry in the stellar surface (e.g., large convective bubbles and cold spots) or the CSM.

Lastly, the input PHOENIX model photospheres of the published GRAMS grid are at a metallicity \( \log[Z/Z_\odot] = -0.5 \), originally chosen to be similar to that of the LMC, while the local environment of M51-DS1 indicates that models at higher, somewhat supersolar, metallicities \( \log[Z/Z_\odot] = 0.0-0.3 \); see Section 4.1) would be more appropriate. Though metallicity will affect the photospheric spectrum in the optical/near-IR, we do not expect this to be significant compared to the effects of an external dusty wind or the possible effects of a complex geometry mentioned above. We examined this by also fitting the pre-fading SED with bare PHOENIX photospheres at low, solar, and high metallicities \( \log[Z/Z_\odot] = -0.5, 0.0, +0.5 \), again including the amount of foreground extinction, \( E(B-V) \), as a free parameter. In general, we find similar results regardless of metallicity. The best-fitting models have \( T_{\text{eff}} = 4300 \) at low and solar metallicities and \( T_{\text{eff}} = 4500 \) at high metallicity, all well within the preferred parameter ranges found for the GRAMS models.

### 4.5. Location in the Hertzsprung–Russell Diagram and Evolutionary State

We examine the possible locations of M51-DS1 in an HRD (Figure 6) and discuss implications for the inferred initial mass and evolutionary state of the star. Specifically, we directly compare the results of applying a simple \( K \)-band bolometric correction (Davies & Beasor 2018, assuming an M-type RSG; see Section 4.2.1) to those of our SED model fitting (Section 4.4.1). Overall, the luminosity of the star inferred from applying \( BC_K \) is lower than that from the SED fitting, falling in the range \( \log(L/L_\odot) \approx 5.15-5.37 \), notably above the range inferred for the growing collection of SN progenitors and comparable to that inferred for the failed SN candidate NGC 6946-BH1, depending on the value assumed for the foreground extinction between \( E(B-V) = 0.0 \) and 1.6 mag. The SED modeling prefers somewhat warmer \( T_{\text{eff}} = 3700-4700 \) K photospheric models at relatively high extinction \( E(B-V) = 0.56-1.56 \) mag) and luminosities in the range \( \log(L/L_\odot) \approx 5.35-5.75 \). Given the constraints on the ISM environment discussed in Section 4.1, high \( E(B-V) \) values \( \gtrsim 1 \) mag would likely point to significant circumstellar extinction.

Even for an early M-type star \( (T_{\text{eff}} \approx 3700 \) K), where there is overlap between the two methods, the inferred luminosity from SED fitting is about a factor of 1.3 higher than from applying \( BC_K \) for the same extinction of \( E(B-V) = 0.8 \) mag. This modest discrepancy could be resolved if the effective extinction law were gray—either from a shallower ISM law (i.e., \( R_V > 3.1 \)) for the central regions of M51 or perhaps related to properties of the stellar wind or circumstellar dust not captured by the models (e.g., nonspherical geometry or nonisotropic scattering by dust grains)—resulting in a smaller correction at bluer wavelengths and a lower bolometric luminosity for a given model. Alternatively, using a smaller \( BC_K \) at earlier spectral types (as found for cool supergiants in the Magellanic Clouds; e.g., Elias et al. 1985; Levesque et al. 2006; Davies et al. 2018) would also bring the luminosity estimates closer to agreement.

Altogether, we infer that M51-DS1 is likely a luminous RSG at \( \log(L/L_\odot) \approx 5.2-5.3 \) (for \( T_{\text{eff}} \lesssim 3700 \) K and reasonable values of \( E(B-V) = 0.4-1.3 \)), corresponding to a highly evolved star of initial mass \( M \approx 19-22 M_\odot \), or somewhat warmer \( T_{\text{eff}} = 3700-4700 \) K—possibly a YSG on a post-RSG track back to higher temperatures—at higher luminosities up to \( \log(L/L_\odot) \approx 5.4-5.7 \). This more extreme case would suggest an initial mass as high as \( M \approx 26-40 M_\odot \) for a star near the empirical Humphreys–Davidson limit in an exceptionally short-lived and rare state of stellar evolution.

### 5. Summary and Conclusions

We have presented a detailed analysis and characterization of a remarkable dimming event of a luminous, cool supergiant star in the nearby, star-forming galaxy M51, found as part of a new search for failed SNe as “disappearing” massive stars with the HST. The object, which we call M51-DS1, was detected dozens of times in the wealth of archival HST imaging for more than two decades since 1995 before undergoing a dramatic, near-total disappearance in the 2019 ACS/WFC F814W images obtained as part of our search. Thus meeting our criteria for a strong failed SN candidate (outlined in Section 3.2), we conducted follow-up HST imaging observations with a Cycle 28 mid-cycle program using ACS/WFC and WFC3/IR, supplemented with ground-based, near-IR imaging from Gemini-N/NIRI and MMT/MMIRS, to attempt to confirm the disappearance of the star. The star was found to have partially rebrightened to near its pre-disappearance levels across the optical and near-IR, ruling out the terminal collapse of the star in a failed SN. As summarized below, our analysis indicates instead that an isolated episode of enhanced mass loss on a very massive, cool Y/RSG star—potentially a rare, more extreme cousin of the recent “Great Dimming” of Betelgeuse—can explain its observed properties.

M51-DS1 is located in the inner regions of M51 along the edge of a spiral arm. Previous studies of the host galaxy suggest an environment of approximately solar or somewhat supersolar metallicity \( \log[Z/Z_\odot] \approx 0.0-0.3 \) and significant foreground extinction \( E(B-V) \approx 0.4-1.0 \) mag). Photometry of stars in the immediate vicinity indicates the presence of a young population \( \lesssim 6 \) Myr old) within a 20 pc radius. M51-DS1 itself is the brightest red source in this region, implying an initial mass of at least \( \approx 30 M_\odot \) if it is part of the same population. It is difficult, however, to disentangle possible confounding effects, including a mix of stellar populations of different ages and high spatial variation in the foreground extinction toward individual sources up to \( E(B-V) \approx 2.0 \) mag. At \( M_K = -11.1 \) mag in 2005 and with \( J - K \approx 1.0-1.2 \) mag (Galactic-extinction correction only), the star is consistent with a luminous RSG, and applying the \( K \)-band bolometric correction of Davies & Beasor (2018) yields \( \log(L/L_\odot) = 5.2-5.3 \), implying an initial mass \( M = 19-22 M_\odot \) (assuming an M-type supergiant with \( T_{\text{eff}} \lesssim 3700 \) K and foreground extinction \( E(B-V) = 0.4-1.3 \) mag). Modeling of the SED suggests higher temperatures \( T_{\text{eff}} \approx 3700-4700 \) K and luminosities \( \log(L/L_\odot) = 5.4-5.7 \), pointing to a more massive (initial mass \( M = 26-40 M_\odot \)) YSG or post-RSG star that would be consistent with the inferred age of the very young stellar population in the immediate vicinity, and possibly requiring circumstellar extinction.

The extended, 26 yr light curve of M51-DS1 indicates a history of variability with \( \Delta F814W \approx 0.7-0.9 \) mag, consistent with semiregular variations typical of Y/RSGs and expected theoretically for massive cool stars above \( \gtrsim 15 M_\odot \). At \( \Delta F814W \gtrsim 2.1 \) mag, we find that the 2019 minimum is unlikely to be part of the typical variation cycle for this star,
but rather an uncommon and exceptionally deep dimming event—notably, more than $\sim 1.5$ mag deeper than the 2019–2020 historic minimum of Betelgeuse in the comparable $I$ band. In the context of other large-amplitude modes of variation seen in luminous red stars in M51, we suggest that the 2019 event of M51-DS1 could be associated with an enhanced episode of mass loss from the star, in which increased opacity from the dense, molecular wind or the formation of new dust grains temporarily obscured the star.

This discovery highlights a central challenge for the definitive identification of failed SNe, namely, that the massive stars in question exhibit optical variability that can mimic a disappearing star. In particular, episodic mass loss in massive, cool supergiants remains poorly understood (e.g., Smith 2014), both in terms of the physical mechanisms that drive it and critical properties such as the frequency, possible duration, and mass-loss rates of the most extreme events; an extended mass-loss event could plausibly obscure a massive star in the optical for years. While Galactic examples of episodic mass loss from cool supergiants, like Betelgeuse’s Great Dimming, can be studied in real time and in exquisite detail, such events will be few and far between. Still, significant progress can be made in mining the ever-growing trove of archival data from both space-based (e.g., HST, Spitzer) and numerous ground-based time-domain surveys to uncover and characterize the population of such sources in nearby galaxies, both as possible contaminants in ongoing failed SN searches and as direct probes of episodic mass-loss in massive, evolved stars. At the same time, a continued, concerted effort to monitor existing and newly uncovered failed SN candidates is vital, especially observations in the near-IR and mid-IR, e.g., soon with the James Webb Space Telescope and later with the Nancy Grace Roman Space Telescope, to test for surviving obscured stars and direct signatures of a potential obscuring wind or dust.

We thank the anonymous referee for their helpful comments that improved the paper. We thank K. Paterson for help with MMIRS imaging data reduction. We also thank the observing support staffs of the MMT, LBT, Gemini Observatory, and the HST for their help in planning, obtaining, and analyzing the observations presented in this work.

Some of the data presented in this paper were obtained from the Mikulski Archive for Space Telescopes (MAST) at the Space Telescope Science Institute. The specific observations analyzed can be accessed via 10.17909/19-z1c2-ye93.

Time-domain research by D.J.S. is also supported by NSF grant Nos. AST-1821987, 1813466, 1908972, & 2108032, and by the Heising-Simons Foundation under grant #2020-1864. J. S. acknowledges support from NASA’s support No. HST-GO-15645.003-A and the Packard Foundation. Research by S.V. is supported by NSF grant Nos. AST-1813176 and AST-2008108. E.R.B. is supported by NASA through a Hubble Fellowship grant No. HST-HF2-51428 awarded by the Space Telescope Science Institute, which is operated by the Association of Universities for Research in Astronomy, Inc., for NASA, under contract NAS5-26555.

Based on observations made with the NASA/ESA Hubble Space Telescope, obtained at the Space Telescope Science Institute, which is operated by the Association of Universities for Research in Astronomy, Inc., under NASA contract NAS5-26555. These observations are associated with programs #HST-GO-15645, 16508, 10452, 14704, 12490, and 12762.

Support for program #HST-GO-15645 and #HST-GO-16508 was provided by NASA through a grant from the Space Telescope Science Institute, which is operated by the Association of Universities for Research in Astronomy, Inc., under NASA contract NAS5-26555.

Observations reported here were obtained at the MMT Observatory, a joint facility of the University of Arizona and the Smithsonian Institution.

Based on observations obtained at the Gemini Observatory (Programs GN-2005A-Q-49 and GN-2021A-DD-101), which is operated by the Association of Universities for Research in Astronomy, Inc., under a cooperative agreement with the NSF on behalf of the Gemini partnership: the National Science Foundation (United States), National Research Council (Canada), CONICYT (Chile), Ministerio de Ciencia, Tecnología e Innovación Productiva (Argentina), Ministério da Ciência, Tecnologia e Inovação (Brazil), and Korea Astronomy and Space Science Institute (Republic of Korea).

We acknowledge with thanks the variable star observations from the AAVSO International Database contributed by observers worldwide and used in this research.

Facilities: HST (ACS, WFC3, WFPC2), Gemini:Gillett (NIRI), MMT (MMIRS), LBT (LUCI-1), AAVSO Software: AstroDrizzle, TweakReg (http://drizzlepac.stsci.edu/; Hack et al. 2012), SExtractor, PSFEx (https://www.astromatic.net/software/, Bertin & Arnouts 1996; Bertin 2011), DOLPHOT (http://americano.dolphinism.com/dolphot/; Dolphin 2000, 2016), DRAGONS (https://dragons.readthedocs.io/en/v2.11/index.html), Astropy (https://www.astropy.org/, Astropy Collaboration et al. 2013; The Astropy Collaboration et al. 2018), photutils, EPSF-Build (https://photutils.readthedocs.io/en/stable/; Bradley et al. 2020).

ORCID iDs
Jacob E. Jencson @ https://orcid.org/0000-0001-5754-4007
David J. Sand @ https://orcid.org/0000-0003-4102-380X
Jennifer E. Andrews @ https://orcid.org/0000-0003-0123-0062
Nathan Smith @ https://orcid.org/0000-0001-5510-2424
Jeniveve Pearson @ https://orcid.org/0000-0002-0744-0047
Jay Strader @ https://orcid.org/0000-0002-1468-9668
Stefano Valenti @ https://orcid.org/0000-0001-8818-0795
Emma R. Beasor @ https://orcid.org/0000-0003-4666-4606
Barry Rothenberg @ https://orcid.org/0000-0003-2283-2185

References
Abbott, B. P., Abbott, R., Abbott, T. D., et al. 2019, PhRvX, 9, 031040
Abbott, R., Abbott, T. D., Abraham, S., et al. 2021, PhRvX, 11, 021053
Adams, S. M., Kochanek, C. S., Gerke, J. R., & Stanek, K. Z. 2017a, MNRAS, 469, 1445
Adams, S. M., Kochanek, C. S., Gerke, J. R., Stanek, K. Z., & Dai, X. 2017b, MNRAS, 468, 4968
Asplund, M., Grevesse, N., Sauval, A. J., & Scott, P. 2009, ARA&A, 47, 481
Astropy Collaboration, Robitaille, T. P., Tollerud, E. J., et al. 2013, A&A, 558, A33
Ayres, T. R., Lyons, J. R., Ludwig, H. G., Caffau, E., & Wedemeyer-Böhm, S. 2013, ApJ, 765, 46
Barbon, R., Buonoli, V., Cappellaro, E., & Turatto, M. 1999, A&AS, 139, 531
Basinger, C. M., Kochanek, C. S., Adams, S. M., Dai, X., & Stanek, K. Z. 2021, MNRAS, 508, 1156
Beasor, E. R., Davies, B., Smith, N., et al. 2020, MNRAS, 492, 5994
Bertin, E. 2011, in ASP Conf. Ser., 442, Astronomical Data Analysis Software and Systems XX, ed. J. N. Evans et al. (San Francisco, CA: ASP), 435
