

# Searching for electromagnetic emission in an AGN from the gravitational wave binary black hole merger candidate S230922g

Tomás Cabrera,<sup>1,\*</sup> Antonella Palmese,<sup>1</sup> Lei Hu,<sup>1</sup> Brendan O'Connor,<sup>1</sup> K. E. Saavik Ford,<sup>2,3,4</sup> Barry McKernan,<sup>2,3,4</sup> Igor Andreoni,<sup>5,6,7</sup> Tomás Ahumada,<sup>8</sup> Ariel Amsellem,<sup>1</sup> Malte Busmann,<sup>9</sup> Peter Clark,<sup>10</sup> Michael W. Coughlin,<sup>11</sup> Ekaterine Dadiani,<sup>1</sup> Veronica Diaz,<sup>1</sup> Matthew J. Graham,<sup>8</sup> Daniel Gruen,<sup>9,12</sup> Keerthi Kunnumkal,<sup>1</sup> Jake Postiglione,<sup>4</sup> Arno Riffeser,<sup>9,13</sup> Julian S. Sommer,<sup>9</sup> and Francisco Valdes<sup>14</sup>

<sup>1</sup>McWilliams Center for Cosmology and Astrophysics, Department of Physics, Carnegie Mellon University, 5000 Forbes Avenue, Pittsburgh, Pennsylvania 15213, USA

<sup>2</sup>Center for Computational Astrophysics, Flatiron Institute, 162 5th Avenue, New York, New York 10010, USA

<sup>3</sup>Department of Astrophysics, American Museum of Natural History, New York, New York 10024, USA

<sup>4</sup>Department of Science, BMCC, City University of New York, New York, New York 10007, USA

<sup>5</sup>Joint Space-Science Institute, University of Maryland, College Park, Maryland 20742, USA

<sup>6</sup>Department of Astronomy, University of Maryland, College Park, Maryland 20742, USA

<sup>7</sup>Astrophysics Science Division, NASA Goddard Space Flight Center, Mail Code 661, Greenbelt, Maryland 20771, USA

<sup>8</sup>Division of Physics, Mathematics and Astronomy, California Institute of Technology, Pasadena, California 91125, USA

<sup>9</sup>University Observatory, Faculty of Physics, Ludwig-Maximilians-Universität München, Scheinerstrasse 1, 81679 Munich, Germany

<sup>10</sup>Institute of Cosmology and Gravitation, University of Portsmouth, Portsmouth, PO1 3FX, United Kingdom

<sup>11</sup>School of Physics and Astronomy, University of Minnesota, Minneapolis, Minnesota 55455, USA

<sup>12</sup>Excellence Cluster ORIGINS, Boltzmannstrasse 2, 85748 Garching, Germany

<sup>13</sup>Max Planck Institute for Extraterrestrial Physics, Giessenbachstrasse 85748 Garching, Germany

<sup>14</sup>NSF National Optical-Infrared Research Laboratory, 950 North Cherry Avenue, Tucson, Arizona 85719, USA



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We carried out long-term monitoring of the LIGO/Virgo/KAGRA binary black hole (BBH) merger candidate S230922g in search of electromagnetic emission from the interaction of the merger remnant with an embedding active galactic nuclei (AGN) accretion disk. Using a dataset primarily composed of wide-field imaging from the Dark Energy Camera and supplemented by additional photometric and spectroscopic resources, we searched  $\sim 70\%$  of the sky area probability for transient phenomena and discovered six counterpart candidates. One especially promising candidate—AT 2023aagj—exhibited temporally varying asymmetric components in spectral broad line regions, a feature potentially indicative of an off-center event such as a BBH merger. This represents the first live search and multiwavelength, photometric, and spectroscopic monitoring of a gravitational wave BBH optical counterpart candidate in the disk of an AGN.

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## I. INTRODUCTION

As multimessenger astronomy continues to develop, the branch of this field dedicated to studying compact binary coalescences stands as an important forerunner as the first to include direct observations of gravitational waves (GWs) [1]. These events manifest phenomena at scales presently unobtainable in manmade environments and hence are important natural laboratories in which to study extreme physics such as heavy element nucleosynthesis [2] and measure key physical quantities such as the expansion rate of the Universe [3,4]. This potential was realized following the first successful multimessenger detection of the binary neutron star merger GW170817/GRB 170817A [5], wherein a global electromagnetic astronomy campaign succeeded in locating a kilonova (KN) [6–23] incident with the initial GW and  $\gamma$ -ray burst (GRB) events [1,24,25]. This single event by itself was enough to result in hundreds of analyses, including constraints on neutron star (NS) physics

\*Contact author: tcabrera@andrew.cmu.edu

(e.g., [26]) and the Hubble constant [27]. In the case of jet [35,36]. A representation of the AGN-associated EM  $H_0$ , it is predicted that O $\tilde{d}100$  binary neutron star (BNS) counterpart mechanism is shown in Fig. events with electromagnetic (EM) counterparts are required Counterpart candidates for BBH mergers from previous to make a  $\sim$  few % measurement of the parameter [28], LIGO/Virgo/KAGRA (LVK) observing runs have been although joint multimessenger constraints on the binary proposed [37,38], although confirmation of a counterpart viewing angle can further improve precision by a factor of  $\sim 2$  has remained challenging. There are several reasons for this few (e.g., [29,30]).

While BNS mergers are the only class of GW event with a confirmed EM counterpart, it is also predicted that binary black hole (BBH) mergers can produce counterparts in certain circumstances. The majority of proposed counterpart mechanisms involve the interaction of the binary or merger remnant with a coexistent medium, usually the gaseous accretion disk of an active galactic nucleus (AGN), whether through accretion [31], ram-pressure stripping of gas about the remnant or jetted Bondi accretion [32], breakout emission from accretion [33,34], or a postmerge

happens in an AGN, in principle, there is only a  $O\tilde{d}1=4\%$  chance that we could detect an EM counterpart: our view of around half of AGN (the type 2s) is obscured, and an unfortunate kick direction out the opposite side of a type 1 AGN could still obscure any emission [38]. Second, even if a flare emerges from an AGN, it must be discerned in the presence of other AGN variability. This makes our task of searching for counterparts more challenging in brighter AGN, and our search is biased against less luminous counterparts. Third, possible flare parameters are weakly

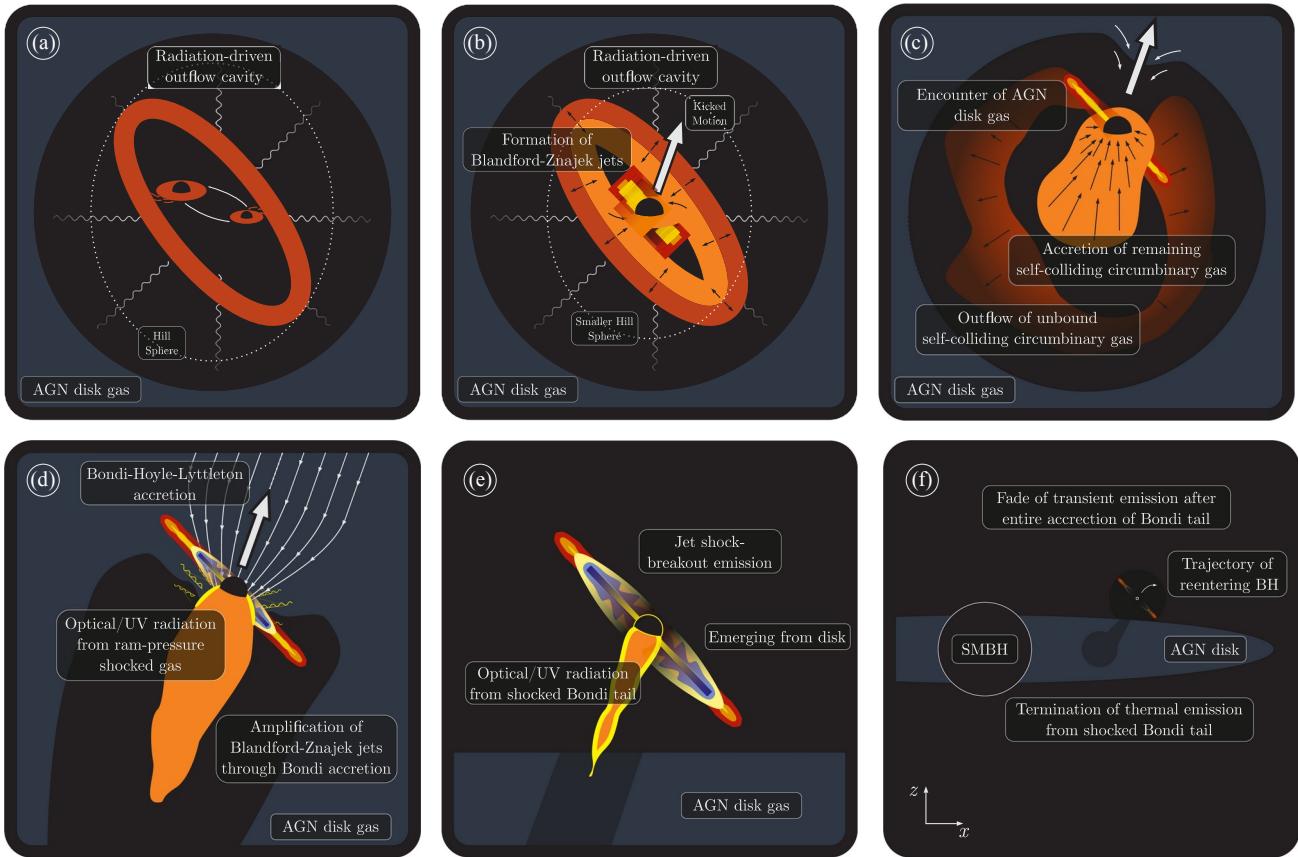


FIG. 1. Multipanel schematic showing the mechanism believed to underpin luminous EM counterparts to BBH mergers in AGN disks. (a) The premerger BBH accretes from minidisks within its Hill sphere in the AGN disk midplane and blows a cocoon within the disk via feedback. (b) The merger happens, forming a highly spinning black hole (BH) (dimensionless spin parameter  $a \sim 0.7$  typically). A jet is presumed to form at this stage (although it has yet to be established whether such a jet can persist for long or whether it is choked off high mass accretion). Mass and spin asymmetries in the progenitor black holes lead to a kick at merger [depicted by the arrow in (b)]. (c),(d) The development of Bondi-Hoyle-Lyttleton (BHL) accretion as the newly merged BH exits its original Hill sphere into the rest of the AGN disk, powering a luminous transient. (e) The BH emerges from the AGN disk, dragging disk gas with it. (f) The EM emission fades as the disk material is consumed and the BH continues on an inclined orbit around the supermassive black hole (SMBH) and will reenter the AGN disk on half the orbital timescale.

constrained, both because AGN disk properties are uncertain to the smallest areas of O4a (the first part of O4, completed to orders of magnitude and because the properties of the postmerger flare depend on these uncertain parameters, visible from Chile in the months following the

One possible means to confirm a counterpart is through trigger, made an effective follow-up with DECam possible optical spectroscopy: because the BBH merger occurs offin pursuit of potential AGN-linked counterparts like those center in the AGN disk, the resulting flare could unevenly mentioned previouslyIn this paper we present our long- illuminate the broad line region (BLR) of the AGN, term monitoring of S230922g; the paper is organized as resulting in asymmetric broad line features in the optical follows: Sec. II presents our program's generic strategy for spectrum [32]. Synchronized evolution of a transient with GW follow-up and the data collected, highlighting such spectra features can be a key piece of evidence in components especially relevant for S230922g. Section III favor of the classification of a transient as a EM counterpart describes the methods we used to distil our population to a BBH merger. At the very least, an evolving asymmetric detected transients into a short list of counterpart line profile suggests an off-center flaring event in the AGN; candidates Section IV describes our most favored candidates, ruling out most sources of AGN variability near the SMBH date, and to a lesser extent additional candidates of interest. Flare energetics and light curve profiles can allow us to rule Sec. V we estimate parameters for our most favored out, e.g., embedded supernovae, leaving few candidates for a counterpart candidate, finding it well within the confines of a sufficiently energetic off-center AGN flare including a existing BBH counterpart theory. In Sec. VI we summarize our findings and highlight considerations relevant for future BBH merger.

Certainly, the search for EM counterparts to BBH mergers has unique challenges versus the search for NS with  $H_0 \approx 70 \text{ km/s/Mpc}$  and matter density  $\Omega_m \approx 0.3$ . merger counterparts (intrinsic AGN variability, delay time uncertainties, etc.); however, as the historical rate of detection of BBH mergers has been  $\sim 100 \times$  greater than that for NS mergers, there are many more opportunities to search for a counterpart to the former kind of event. S230922g is an event of interest because it was detected with high significance (False Alarm Rate of one per  $1.6 \times 10^{-16}$  yr from GstLAL [53, 54]) by both LIGO Livingston and LIGO Hanford, it is well localized compared to the O4a potential to significantly contribute to the multimessenger population, and it has  $\sim 100\%$  probability of being a BBH. observations required to make the first 2% measurement of the Hubble constant with standard sirens, which is the level of precision needed to help us understand the Hubble tension [28].

In this work, we present results from our follow-up of the highly uncertain with an error bar of at least a factor of 2. GW event S230922g. S230922g is a LVK BBH merger. This uncertainty is informed from the calibration of the candidate detected at September 22, 2023 02:03:44.886 proposed mass relationship with the LIGO O3 BBH UTC [51,52]. The 90% credible region of 324 days one dataset.

## II. DATA

## A. GW data

## B. DECam observations

Our team was notified of S230922g through a General Coordinates Network (GCN) listener<sup>1</sup> that sent a digest of the event to our Slack workspace<sup>2</sup>. Our first response was to generate an initial observing strategy with WEMOPT [61] to assess the probability coverage possible with a single night of DECam observations. WEMOPT selects exposure pointings from a preset sky tiling. Because our image subtraction pipeline uses archival DECam exposures as templates, we implemented a custom tiling based on images calibrated by the National Science Foundation National Optical-Infrared Research Laboratory (NOIRLab) DECam community pipeline (CP) [62] and made available through the NOIRLab Astro Data Archive<sup>3</sup> [63] to ensure our observing plans include pointings with usable templates. During each observing night, the CP calibrates the response and astrometry of each exposure shortly after it is taken which is then available to the image subtraction pipeline.

We determined that 70% of the GW localization area could be covered with 60 and 80 s DECam exposures in  $g$  and  $i$  bands, respectively, with  $\sim 4.7$  h of telescope time. Our DECam tiling is shown in Fig. 2, overlaid on the LVK Bilby sky map [52] for S230922g. When this plan was finalized, we communicated our pointings to the larger astronomical community through the GW Treasure Map [64], and we updated information appropriately as we executed our plan.

Because most BBH counterpart models concern the emergence of an EM signature from the interior of an AGN disk, delays of  $10\text{--}100$  days are expected before such a signature becomes observable. Even so, it is valuable to initiate EM follow-up for these kinds of events within a few days of the GW trigger, as high-cadence archival data are generally not available in the localization area of a given GW event and a baseline of sources in the localization area can be useful when vetting candidates. Accordingly, we decided to trigger our target of opportunity (ToO) program for the night following the event (the evening of September 22, 2023) in order to establish a baseline of activity at the

GW merger time and to facilitate the identification of novel phenomena in subsequent observing epochs.

On the first night we were only able to complete  $\sim 1$  h of observations before inclement weather began, but we were able to observe our full plan in its entirety the following night (September 23, 2023). We publicly reported transients in the area through GCN within 24 h of these observations [65]. Further observations were conducted

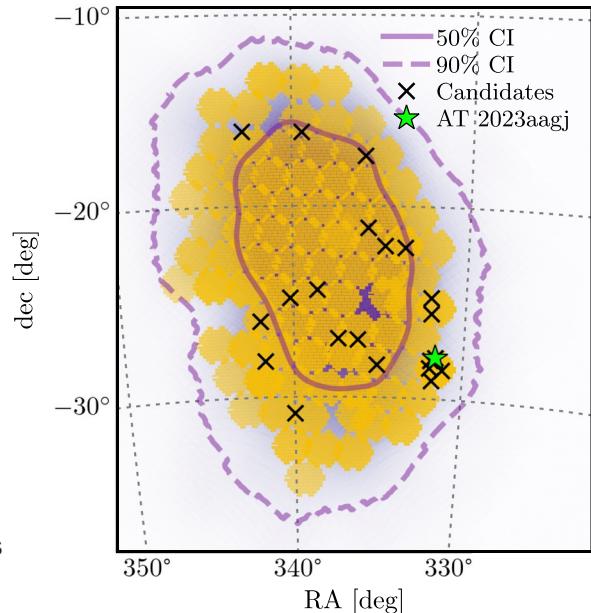


FIG. 2. Our observation plan for follow-up of S230922g. The LVK sky map for the event is plotted on the lower layers of the figure, and the 50% (90%) credible interval regions are outlined in the solid (dashed) line. The candidates composing our short list are shown as black X's, with our favored candidate indicated with a green star.

33, 41, and 70 days after the LVK trigger (October 3, October 25, November 2, and December 1, 2023). As we processed the data throughout the campaign, we took additional observations of the most interesting candidates, adding up to eight epochs altogether. We submitted all transient sources discovered through this campaign to the Fritz SkyPortal [60, 66]. After composing our final candidate short list (as detailed in Sec. III), we reported the respective sources to the Transient Name Server (TNS).

## C. Spectroscopic observations

BBH counterpart models have some degeneracy with those for stochastic AGN variability and other transient events like tidal disruption events (TDEs), but spectroscopic data has been predicted to serve as a key discriminator among these phenomena: specifically, the off-center location of a BBH merger in the accretion disk of the AGN as opposed to the central location of TDEs or accretion-based phenomena is expected to induce asymmetry in the broad lines of AGN spectra as the transient event “washes” over the BLR in an asymmetric manner [32]. The detection of a BLR asymmetry evolving in concert with the light curve of a transient is a smoking gun that locates the transient in an off-center position in the accretion disk. This signature is expected for BBH merger counterparts, and the coincidence of such an event with a GW merger is strong evidence linking the merger to the AGN flare.

<sup>1</sup>Adapted from <https://github.com/scimma/slackbot>.

<sup>2</sup>Our team also uses the Fritz science data platform [60] for notifications of GW events via phone call but we reserve this kind of notification for exceptionally time-sensitive events such as BNS and NS-BH mergers.

<sup>3</sup><https://astroarchive.noirlab.edu/>.

<sup>4</sup><https://treasuremap.space/>.

In pursuit of such evidence, we triggered several spectroscopic resources for additional follow-up of transients whose light curves demonstrated proposed counterpart features (see Sec. II A). A total of five spectra were collected during our follow-up campaign: two with Gemini Multi-Object Spectrograph (GMOS) and one each with Keck Low-Resolution Imaging Spectrograph (LRIS), South African Large Telescope (SALT) Robert Stobie Spectrograph (RSS), and P200 Double Spectrograph (DBSP). We discuss the methodology for each spectrum in the context of the respective candidate in Sec. IV B.

### III. METHODS

#### A. Automated vetting

We analyze our data with our difference photometry pipeline described in [67]. We perform image subtraction with Saccadic Fast Fourier Transform (SFFT) [68], a scalable image subtraction algorithm and GPU-enabled implementation of the same that produces difference images up to an order of magnitude faster than widely used tools with comparable accuracy. Aperture photometry is conducted on the resulting difference images using SExtractor [69] with fluxes calibrated to the Dark Energy Spectroscopic Instrument (DESI) Legacy Survey (LS) source catalog and corrected for extinction using the DUSTMAPS package [70] and the E<sub>B</sub> – V<sub>B</sub> coefficients from [71]. Our image differencing pipeline detected over 25 million transient features in our campaign data, which we distilled into a tractable list of astrophysical transients through a series of cuts. Table I summarizes the vetting steps we applied which are described in this section.

We first remove any detections on difference images contaminated by bad pixels recorded in the DECam CP data quality mask products. Surviving features were then scored using a rotation-invariant convolutional neural network (CNN) [72, 73] trained on archival DECam data products from our pipeline to perform real/bogus classification.

Possible CNN scores range from 0 to 1, with higher scores associated with more realistic astrophysical objects. From testing on archival DECam data, a threshold of 0.7 was found to facilitate a 98% recall rate with a 7.2% bogus contamination rate; this threshold was accepted as our cutoff for this analysis. Roughly 6% of the initial list of detections passed these steps to form our list of real astrophysical detections.

These detections were then cross-matched among themselves to identify features present in data from multiple epochs and filters; the resulting list of transients consisted of 233,313 objects. This list was subsequently cross-matched with the LS DR10.1 catalog [74] and the Minor Planet Center (MPC) service, and any transients, respectively, matched to starlike sources (defined as a source assigned a LS morphological type of “PSF”) or minor planets were removed from our search. The LS cross-match was also used to sort the sources into three

TABLE I. Summary of selection cuts applied to our pipeline products. The table is split into two sections: cuts applied to individual difference image detections (first three cuts) and those applied to multiepoch light curves composed of coincident detections (remaining six cuts).

Vetting filter	Number passed	Fraction passed
Detection-based cuts		
Initial photometry detections	25,392,140	1.00
Data quality masking	14,053,259	0.553
Real/bogus score $\geq 0.7$	1,501,800	0.059
Source-based cuts		
Initial transients	233,313	1.00
Remove LS variable stars	140,230	0.601
Remove MPC objects	18,528	0.079
$\geq 1$ real/bogus score $\geq 0.9$	17,515	0.075
$\geq 2$ detections with $\Delta t \geq 30$ min	3558	0.015
LS galaxy separation $\leq 1$ arc sec	2388	0.010
Additional vetting	6	$2.6 \times 10^{-5}$

categories based on proximity to the nearest galaxy-type LS source: sources within 0.3 arc sec of a galaxy-type source were labeled as “A” sources, sources greater than 1.0” away from the nearest such source were labeled as “T” sources, and sources falling in the middle ground between these two categories were labeled as “C” sources.

Two final cuts were then applied to limit our search to the most realistic persistent sources, requiring sources to have at least two distinct observations separated by  $>30$  min and at least one high-fidelity detection (real/bogus CNN score  $\geq 0.9$ ). Of the remaining 3558 sources, 2388 of them were within 1 arc sec of a galaxy-type LS object (A and C sources); this final group composed our automated list of candidates based on our photometric DECam data. See Table I for a summary of cuts applied and resulting numbers of candidates at each cut.

#### B. Additional vetting

Our 2388 automatically identified sources were then examined by eye to identify candidates for further study. Sources flagged for further investigation included those that had brightened since the time of the GW event and did not exhibit early reddening (this latter criteria was motivated by the expectation that the luminous counterpart emerges from the depths of the accretion disk, see Fig. 1, and we do not expect it to redden as the optical depth decreases). Other considerations included whether there was a perceptible delay time from the GW event time (reflective of an EM counterpart needing time to escape the

<sup>5</sup>We consider all LS sources with morphological types other than PSF (stellar) and DUP (extended source components); “galaxy-type” sources.

embedding accretion disk before being observed) and whether sources appeared similar to different known transients such as supernovae (SN). Image stamps were also examined for each source to exclude any artifacts and the like that survived the CNN cut.

The resulting list was trimmed to remove any transient over  $2\sigma$  away from the GW distance posterior, as such information was available. To determine distances to each transient, the LS galaxy-type object matched to each transient was cross-matched with several galaxy catalogs (with a search radius of 1 arc sec) in search of a redshift measurement. Galaxy catalogs used included the NASA/IPAC Extragalactic Database Local Volume Sample (NED-LVS) [75]<sup>6</sup>, the DESI galaxy catalog [76], and Quaia [77]; LS DR10.1 photometric redshifts were also included. If the host galaxy matched in multiple catalogs, then the best redshift measurement was used, preferring spectroscopic redshifts over Quaia “spectrophotometric” redshifts [77] and the latter over photometric redshifts. Comparing the available redshift measurements to the distance posteriors (taken from the sky map ALPix<sup>7</sup> tile containing the respective transient) informed the elimination of sources beyond the  $2\sigma$  threshold cut, using the large of the two uncertainties between the GW and galaxy catalog measurements. Note that transients whose host galaxy lacked any redshift measurement were not subject to this cut.

Candidates in our short list were photometrically classified with Parametrization of Supernova Intrinsic Properties (PaSNIP) [78], assuming a model trained on the PLAsTiCC [79] simulations; because PaSNIP uses redshift as an input parameter, this classification was limited to only those sources with a redshift measurement. When classifying a light curve, PaSNIP assigns a probability to each of a set list of transient classes so that the total probability sums to 1, with each probability reflecting the relative likeness of the light curve to each class. We note that PaSNIP does not contain a catch-all class such as “other” for use when classifying transients of unfamiliar phenomenology: that is, if a transient is strongly dissimilar to all but one of the classes, it could receive a high classification probability for that one class, even if it is not a strong match in and of itself. We consider the “TDE” PaSNIP class as the one most similar to the AGN flares of interest (all other classes concern some kind of SN, except for the KN class, whose typical timescales are considerably shorter than those we are interested in). Accordingly, in the use case we broadly interpret transients classified as TDE as those that are not identifiable as SN-like events, and refer to the TDE class as “non-SN” to better reflect this perspective. We find that most of our classified transients receive this classification.

The final short list of 23 transients surviving these cuts is shown in Table II. We separate several subsets from this list to identify transients that we exclude from our search via asynchronous analysis after our follow-up campaign; these subsets appear in labeled sections of the table. Six of the transients in our short list showed significant brightening, but did not peak during the time they were observed (so potentially consistent with longer-term AGN variability), and so we are unable to consider their full nature with our present dataset. Nine transients, while initially interesting for further monitoring, exhibited reddening in later epochs, and so are excluded through disagreement with our assumed counterpart model that predicts a signature that becomes more blue with time. Finally, two transients were excluded as counterpart candidates through spectroscopic classification (see Secs. IV B 2 and IV B 3). The remaining six transients are those that cannot be excluded as counterparts to S230922g and are listed at the top of the table. Table II includes host redshift information (where available), along with GW sky map localization information: the  $1\sigma$  distance posterior expressed as redshift under the assumed cosmology and the 2D and 3D credible interval (CI) as calculated with the LIGO\_SKYMAP\_postprocess\_crossmatch\_crossmatch routine<sup>8</sup> [80]. The transients are ranked by ascending 2D CI, such that the objects in the highest probability regions are listed first. The highest-probability TNS class and the associated probability are listed in the last two columns of the table, where available.

#### IV. CANDIDATE COUNTERPARTS

In this section we describe candidate counterparts that received particular scrutiny during our campaign, including one we identify as the most likely to be a counterpart to S230922g. While we generally refer to candidates by their TNS name, we include the internal name for each of our transients as well, as these names were used for initial reports. Internal names are assembled from the date of discovery and right ascension/declination (RA/Dec) of the source; for example, the internal name of C202309242206400m275139 refers to a transient first detected on September 24, 2023 with an RA/dec of 22 h 06 m 40.0 s,  $-27^\circ 51$  m 39 s (the letter between the RA and dec can be either “p” or “m,” denoting a positive or negative declination, respectively). The leading character in the object names indicates the proximity of the transient to the nearest galaxy-type LS source, in the same convention explained in Sec III A (A for nuclear sources, T for non-nuclear sources, and C for marginally nuclear sources). The internal names for all transients in our short list can be found in the subfigure titles of Fig. 5.

<sup>6</sup><https://ned.ipac.caltech.edu/>.

<sup>7</sup><https://healpix.sourceforge.io/>.

<sup>8</sup><https://lscsoft.docs.ligo.org/ligo.skymap/postprocess/crossmatch.html#ligo.skymap.postprocess.crossmatch.crossmatch>.

TABLE II. Summary table for our counterpart candidate short list. Redshifts are shown as available from cross-matching with several extragalactic databases and direct measurement from our spectra. The luminosity distances and uncertainties are reproduced from the GW sky map, using the DISTMU and DISTSIGMA values for the tile in which the transient is located. The objects are sorted by ascending 2D sky map probability CI, such that the objects in the highest probability regions are listed first. The highest probability ParSNIP photometric classification along with the probability are listed in the last two columns; in this work, we ~~reanalyze~~ ~~these~~ TDE as non-SN (see text). The last three subdivisions of the table include transients that did not peak during our observation window, those that reddened in later epochs, and those that were excluded as possible counterparts through spectroscopic classification. The source column specifies the source of the redshift measurement for the object; specz indicates a spectroscopic redshift, photz indicates photometric redshift and SPz indicates the Quaia-specific spectrophotometric redshifts described in the catalog paper [77].

Object	Host redshift		GW sky map			ParSNIP	
	$z_{\text{host}}$	$z_{\text{host}}$ source	$d_L$ (Mpc)	2D CI	3D CI	Classification	Probability
AT 2023adwb			1360 430	0.136			
AT 2023uho			1250 552	0.484			
AT 2023adwp			1274 433	0.652			
AT 2023aagj	0.184	Specz (this work)	1478 425	0.754	0.829	Non-SN	0.944
AT 2023adwt			1429 413	0.756			
AT 2023uea	0.195 0.084	Quaia SPz	1459 426	0.790	0.814	Non-SN	0.991
Transients without peak							
AT 2023radio	0.212 0.097	Quaia SPz	1410 446	0.242	0.363	SNII	0.901
AT 2023adwd			1328 451	0.285			
AT 2023adwe	1.528 0.671	LS photz	1293 463	0.285		Non-SN	0.927
AT 2023adwn	0.349 0.078	LS photz	875 486	0.617	0.810	Non-SN	0.676
AT 2023adwq	0.391 0.112	Quaia SPz	1545 454	0.683	0.784	Non-SN	0.968
AT 2023adfo			1471 422	0.729			
Reddening transients							
AT 2023adwc	0.216	NED specz	1228 445	0.143	0.080	Non-SN	0.996
AT 2023adwf	0.180	NED specz	1148 417	0.300	0.155	Non-SN	0.985
AT 2023adwj			1345 457	0.429			
AT 2023uec			1127 469	0.459			
AT 2023uos			1448 458	0.475			
AT 2023adwl			1051 441	0.583			
AT 2023unj			1127 439	0.642			
AT 2023unl	0.248	Specz (this work)	1535 444	0.677	0.652		
AT 2023adws	0.178	NED specz	1451 419	0.750	0.827	Non-SN	0.928
Excluded via spectra							
AT 2023aden			1154 451	0.658			
AT 2023uab	0.128	Specz (this work)	919 479	0.785	0.554	SNIIa	0.814

### A. AT 2023aagj (C202309242206400m275139)

We consider AT 2023aagj to be the transient from our sample most likely to be an optical counterpart to S230922g. This transient is distinguished by a  $\sim 1$  magnitude brightening over a period of a month, remaining blue in color throughout its evolution. It is within 0.5 arc sec of the host galaxy centroid, and as such may be associated with activity in the host nucleus. Difference photometry, spectra, and sample stamps for this candidate are visible in Fig. 3. ParSNIP classifies AT 2023aagj as a TDE/non-SN-type object with a probability of 94.4%, which in this context distinguishes the transient from SNe and the like.

Two spectra of AT 2023aagj were taken before the transient faded. The initial Keck LRIS spectrum, taken on December 7, 2023 (PI: Kasliwal, PID: C360), and reduced with the standard `LPipe` routine [81], revealed ionized gas emission lines and broad line features for the H $\alpha$  and MgII.

regions, indicating a possible AGN host. The redshift of the host was calculated to be 0.184, placing the transient within the 83% credible volume for the S230922g sky map and consistent at the 1.4 $\sigma$  level with the luminosity distance posterior of the GW event. An additional spectrum of the object was taken with Gemini North GMOS (GN-GMOS) on December 25, 2023 (PI: Cabrera, PID: GN-2023B-DD-109), using a B480 grating with 2  $\times$  900 s dithered exposures and a central wavelength of 6250 Å. The data were reduced with Data Reduction for Astronomy from Gemini Observatory North and South (DRAGONS) [82], and flexure corrections were applied by rerunning the reduction

software without sky subtraction and calculating a scalar degree of asymmetry (skewed toward the redder wave-lengths) in both the H $\alpha$  and MgII broad lines as seen in

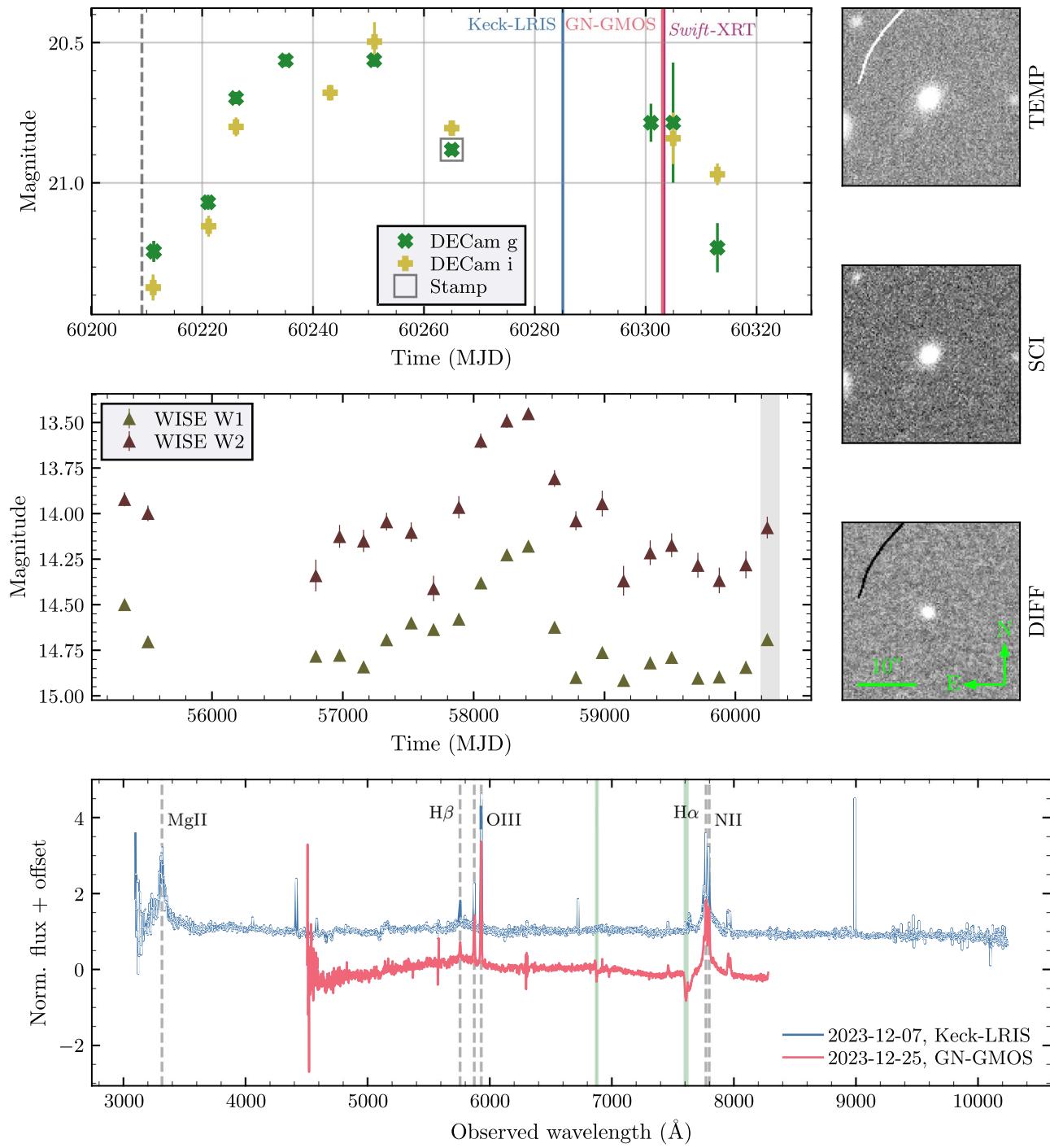


FIG. 3. Observational data for AT 2023aagj. Upper left: difference photometry for the transient.  $g\delta i\text{p}$ -band data are shown in green (yellow). The dashed gray line marks the GW event time of S230922g, and the colored vertical lines indicate the times additional data (spectra and x-ray) were taken. Upper right: stamps from the template, science, and difference images for a sample epoch; the epoch from which the sample stamps are taken is outlined in the photometry plot with a gray square. Center left: WISE photometry for the host of AT 2023aagj. The span of the difference photometry plot is shaded in gray. Bottom: spectra taken for the transient. Telluric regions shaded in green. Several known emission lines (shifted according to the measured redshift of the host) are labeled and shown as dashed gray lines.

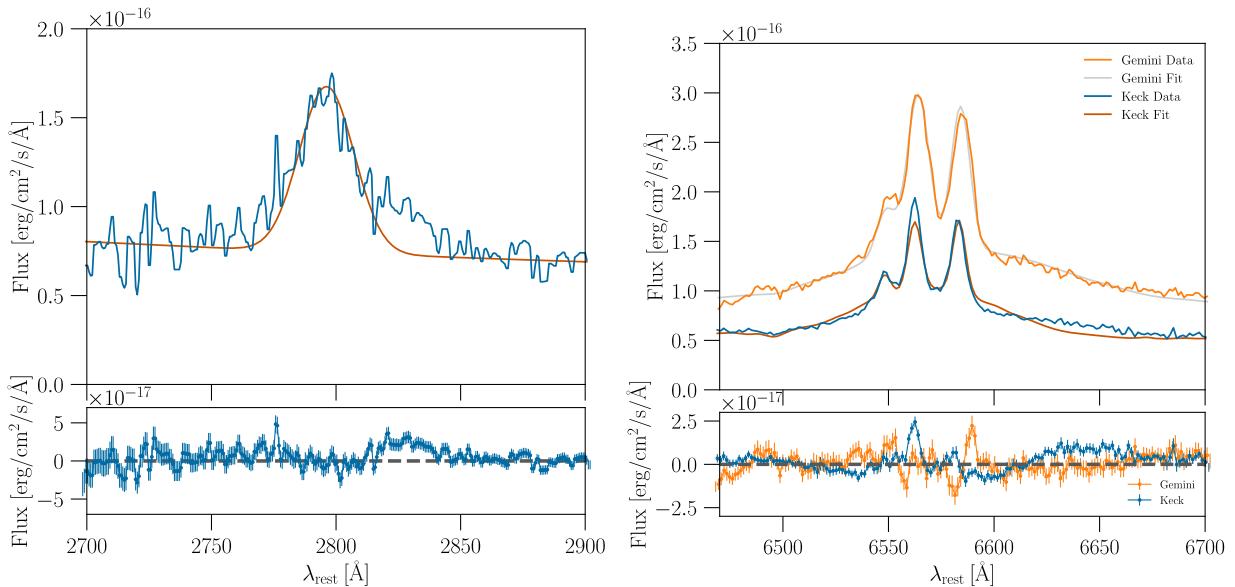


FIG. 4. PPXF model and data for the two AT 2023aagj spectra around the two broad lines of interest. The bottom panels show the residuals between the model and data. An asymmetry redward of the line appears to be present in the Keck spectrum, taken closer to peak, but disappears in the later Gemini spectrum.

Fig. 4; however, the H $\alpha$  asymmetry does not appear in the later Gemini North-GMOS spectrum. The latter spectrum does not cover the MgII feature, and so no comparison between the two times is possible in this regime. Given that there is no similarly resolved archival spectrum for this source, we are not able to distinguish transient spectral features from persistent host features at this time.

We fit the Gemini spectrum using the Penalized Pixel-Fitting software (PPXF [84]) in order to study the possible presence of an AGN. We fit the spectrum with stellar templates from the E-MILES SSP library [85] along with a number of narrow and broad Gaussian peaks corresponding to various emission and absorption lines. Using these measured gas line strengths we place this object in the Baldwin-Phillips-Terlevich diagram finding that it lands in the “composite” region (according to the delineations of [86–88]). This indicates that it is likely that the observed lines are due to a combination of star formation and AGN activity. We further measure the mass of the AGN using the fitted H $\alpha$  velocity dispersion, which we find to be 2282 ± 41 km=s. The resulting BH mass according to the method presented in [89] is  $M_{\text{SMBH}} \sim 2 \times 10^7 M_{\odot}$ . Note that this measurement may be inaccurate if the transient is significantly contributing to the BLR emission.

Wide-Field Infrared Survey Explorer (WISE) [90] infrared data for the host of this event is shown in Fig. 3. Following [91], we retrieved this data from the NASA/IPAC infrared science archive utilizing data from both the ALLWISE [92] and NEOWISE Reactivation Releases [93,94]. Individual observations are combined following

quality control cuts to obtain one mean magnitude per filter for each observation period, providing a ~6 month cadence. The host is found to have brightened by ~0.2 mag (with typical photometric uncertainties ~0.05 mag) in both W1 and W2 bands starting around modified Julian date (MJD) 57900. The SkyMapper data release [95] shows that the object brightened by ~0.13=0.1 mag (uncertainties ~0.05 mag) in g=r-band 5 arc sec aperture photometry over MJD 57870–57875. A possible explanation for these phenomena identifies the infrared (IR) component as a reprocessed signature of the optical event; while blue, this event is slower than AT 2023aagj, which at one point brightened by ~0.4 mag in both g and i bands over a 5 day interval. We also examine archival DECam and PanSTARRS [96] data covering this object, but are unable to put further constraints on past activity, in part due to the sparse temporal coverage of these datasets in this region. We also produce a WISE color-color plot for W1-W2 versus W2-W3, although this is not shown as W3 is only available in one epoch, which may not be representative of the entire color evolution of the object over the past years. By comparison with populations of extragalactic objects (as defined in [90]) we find that, while the host most clearly lies in the WISE population regions associated with spiral and luminous infrared galaxies, it is near the boundary into the Seyfert and quasar parameter spaces and has been observed to temporarily visit these regions.

We carried out a ToO observation of AT 2023aagj with the Neil Gehrels Swift Observatory [97] x-ray telescope (XRT [98]). Our observation began on December 25, 2023 at 06:02 UT with a total exposure of 3265 s in photon counting (PC) mode. We used the Swift-XRT automated

<sup>9</sup><https://irsa.ipac.caltech.edu/>.

tools [99,100] to analyze our data and all previous data covering the source position from May 2006 and April 2021 (totaling 7.8 ks exposure in PC mode, including the latest data). We measure a source position of RA, DEC  $\delta J2000 \approx 206^{\text{h}}40^{\text{m}}26^{\text{s}}$ ,  $-27^{\circ}51'41.8$  arc sec with an uncertainty radius of 4.7 arc sec (90% confidence). In our latest observation the source displays a soft spectrum with all photon counts below 5 keV, similar to the previous observations. The time-averaged spectra were fit with an absorbed power-law model using xSPEC v12.14.0 [101] within HEASoft v6.32. The inferred photon index is relatively unconstrained but favors  $\Gamma \approx 2.5$  with hydrogen column density  $N_{\text{H}} \approx 2 \times 10^{20} \text{ cm}^{-2}$ . The unabsorbed flux (0.3–10 keV) is  $F_{\text{X}} \approx 3.2^{+0.8}_{-1.0} \times 10^{13} \text{ erg cm}^{-2} \text{ s}^{-1}$  in our latest observation. We find a factor of  $\sim 4$  increase in flux between the 2006 and 2021 observations, but no significant change (a factor of  $\sim 1.2$ –0.5) between 2021 and 2023 (due also to the larger errors on the flux). We therefore conclude that there is no ongoing x-ray outburst from AT 2023aagj, although we note that these observations were taken  $\sim 2$  months after the optical peak at a time when any additional flux from the transient may have been too faint to be detected. It is interesting to note how the WISE flare peaked around 2018, notably coincident with the significant change in x-ray flux. We speculate this may be related to a changing look AGN event, although this is hard to confirm due to the lack of an older spectrum.

### B. Other candidates of scrutiny

We took spectra for three additional candidates beyond AT 2023aagj during our follow-up campaign. The spectrum for one transient (AT 2023uab) provides inconclusive evidence for the nature of the source; however, the source was observed to redden in later epochs and so is disfavored by our assumed counterpart model. The spectra for the other two transients (AT 2023aden and AT 2023uab) contain SN-like features; both of these transients are subsequently excluded as possible counterparts to S230922g. The three spectra are shown in Fig. 9 (see the Appendix).

#### 1. AT 2023uab (C202310042207549m253435)

The spectrum for AT 2023uab was taken by the RSS [102,103] on the SALT [104]. The RSSMOS pipeline [105]<sup>10</sup> was used for the reduction of SALT-RSS data. The pipeline automatically identifies and extracts one-dimensional spectra using the data products delivered by the SALT observation team. Using the known redshift of the object and the reduced spectra, PyQSOFit [106]<sup>11</sup> was then used to fit and identify possible emission lines in the data. The SNR for the spectrum is relatively low, with few strong features. The present H $\beta$  line does not demonstrate any

unusual characteristics such as asymmetry. A possible broad line feature is present around an observed wavelength of 5525 Å, albeit a chip gap appears to have ended up at the peak of the feature, and so it is uncertain how much of the observed variation is due to imperfect data reduction; that said, there is no similar feature around the second chip gap near 6575 Å. We conclude there is no conclusive evidence for this transient being in an AGN.

#### 2. AT 2023aden (A202310262246341m291842)

A spectrum was taken for this transient using Gemini North GMOS on November 16, 2023 (PI: Cabrera, PID: GN-2023B-DD-103) and was acquired and reduced in a similar manner as the Gemini spectrum for AT 2023aagj, with a central wavelength of 7600 Å. The spectrum is blue and has strong absorption features characteristic of SNe; subsequently, we do not consider this transient as a likely counterpart to S230922g.

#### 3. AT 2023uab (C202309242248405m134956)

We used the DBSP mounted at the 200-in. Hale Telescope at Palomar Observatory. For this source, we used a 1.5 arc sec slitmask, a D55 dichroic, a blue grating of 600=4000, and a red grating of 316=7500. The data were reduced using a custom PyRAF-DBSP reduction pipeline [107]. The spectrum exhibits clear H $\alpha$  and H $\beta$  features that enable a redshift measurement of 0.128 (computed with REDROCK [108]; Bailey et al. [109]). The continuum of the spectrum peaks around  $\sim 5000$  Å, with several broad absorption features around the peak. This, in concert with PaSNIP classifying the object as a type Ia SN, leads us to exclude this object as a possible counterpart.

## V. DISCUSSION

We return to our favored counterpart candidate AT 2023aagj and assess its significance as an AGN transient. The persistent blue color of the transient distinguishes it from the phenomenology of typical supernovae, separation further supported by a PaSNIP classification of TDE/non-SN as noted above. We apply structure function arguments as presented in [41] to the photometry to calculate the probability that the observed variation occurred as a result of typical AGN activity. We find the variability of AT 2023aagj is significant on the  $5.9\sigma$  level, with an associated one-sided Gaussian probability of  $\sim 10^{-16}$ ; such a low value makes it highly unlikely that AT 2023aagj is a feature of the host AGN's activity and strongly prefers the model of AT 2023aagj as a specially transient phenomenon. Taking the 90% CI volume of the event as  $3.73 \times 10^8 \text{ Mpc}^3$  (as calculated with LIGO SKYMAP) and fiducial AGN number densities of  $10^{-4.75}$  and  $10^{-4} \text{ Mpc}^{-3}$  [110,111] [the two values reflect expected and conservative (more AGN/background flares) rates], we estimate counts of 6600 and 37,000 AGN in the

<sup>10</sup><https://github.com/mattyowl/RSSMOSPipeline>.

<sup>11</sup><https://github.com/legolason/PyQSOFit>.

volume. Alternatively, cross-matching the Milliquas [112] quasar catalog with the sky map (also with [GO\\_SKYMAP](#)) yields a 3D match of 826 objects. Given the discovery window of our follow-up campaign  $t_{\text{window}} \approx 92$  days (calculated as the difference in time between the second epoch and the last), we calculate the probability of a chance discovery of a similar flare as

$$p_{\text{cc}} \approx \frac{t_{\text{window}}}{\Delta t_{\text{rise}}} p_{\text{flare}} \approx \frac{4.48 \times 10^{16} \text{ flares}}{\text{AGN}} n_{\text{AGN}}; \quad \delta 1\text{P}$$

which predicts  $p_{\text{cc}} \sim 10^{-12}\text{P}$  and  $10^{-11}\text{P}$ , and  $p_{\text{cc}} \sim$

$10^{-13}\text{P}$  for the number density and Milliquas estimates, where  $H$  is the disk height and  $\text{m}_p$  is the midplane optical depth. We note that, while these rates distinguish AT 2023aa as a special event, due to uncertainties in the understanding of BBH counterpart morphology the identity of AT 2023aa as a counterpart to S230922g remains largely uncertain. A caveat of this analysis is that we also cannot account for the variability of this specific AGN given the lack of long-term monitoring from archival data.

We compare our candidate flare with the sample of Zwicky Transient Facility (ZTF) transients from [38]. Assuming a roughly constant spectral flux density across the g- and B-band frequency domain, we apply the B bandpass bolometric correction of 5.15 from [113] to derive a total flare energy of

$$E_{\text{tot}} \approx 4\pi \int_{t_d}^{t_e} dv T_B \delta v B \int_{t_d}^{t_e} dt 10^{-0.1m_{g,B} \delta t} B^{48.6} \approx 1.2 \times 10^{50} \text{ erg}; \quad \delta 2\text{P}$$

where  $T_B \delta v B$  is the transmission function for the B bandpass [114], and  $t_d$  and  $t_e$  are the times of the first and last observations of the flare. Fitting a Gaussian rise-exponential decay model to the g-band light curve yields a rise time parameter (the standard deviation of the Gaussian) of  $t_{\text{rise}} \approx 5.25$  days. This places this transient in an intermediate regime between the SN and TDE populations from [38] (cf. Fig. 2 in that paper) among fast TDEs and high-energy SNe. Notably, the [38] proposed flare counterparts are all slower and more energetic than AT 2023aa. This may be associated with the measurement of our flare parameters being based on difference photometry, while the ZTF light curves used in the compared study are assembled via direct photometry that includes the flux of the host AGN.

We estimate physical parameters of the system following the methodology of [37], which tests the hypothesis that the flare is generated from a Bondi accreting BH as the remnant emerges from the accretion disk due to a postmerger kick. With a flare onset time delay of  $\sim 2$  days from the GW trigger and total mass estimate of  $M_{\text{BH}} \approx 90M_{\odot}$ , under the assumption of association we can conclude one or more of the following: either (i) the kick velocity  $v_{\text{kick}}$  is large, (ii) the disk is geometrically thin [aspect ratio

$h \leq 10^{-3}\text{P}$ ], (iii) the disk is not optically thick away from a geometrically thin midplane, or (iv) there is a cavity in the disk due to feedback from the premerger BBH.

We continue by assuming the kick velocity is not specially large or small. If we assume a kick velocity  $v_{\text{kick}} \sim 2000\text{ km/s}$  (which is consistent with the peak of the prior in [115]) then we can constrain the approximate disk height from [38]

$$t_{\text{exit}} \sim \frac{H^p \ln \frac{H}{2 \ln T_{\text{mp}}}}{v_{\text{kick}}}; \quad \delta 3\text{P}$$

which predicts  $p_{\text{cc}} \sim 10^{-12}\text{P}$  and  $10^{-11}\text{P}$ , and  $p_{\text{cc}} \sim 10^{-13}\text{P}$  for the number density and Milliquas estimates, where  $H$  is the disk height and  $\text{m}_p$  is the midplane optical depth. Since  $t_{\text{exit}} \sim 2$  days,  $T_{\text{mp}} \sim 10^{13.6}$  yields a factor 4–5 from the square root, so  $H \sim 0.3r_g \delta M_{\text{SMBH}} = 2 \times 10^7 M_{\odot} \text{P}$ . This implies a thin disk, possibly similar to the thin regions of a [116] model, which also has a lower  $T_{\text{mp}}$  than other models such as [117]. The thinner regions of AGN disks are where gas damping is most efficient and consequently where mergers are more likely to occur [118].

If we assume from Fig. 3 that the flare begins 2 days post-S230922g, and the flare lasts through the spectra denoted by the blue and red lines, then the overall flare duration is  $t_{\text{flare}} \sim 10^6 \text{P}$  days. We note that this is to be considered a rough estimate of the flare timescale in what follows. Given  $E_{\text{tot}} \sim 10^{50} \text{ erg}$ , the average luminosity of the flare is  $L_{\text{flare}} \sim 10^{43} \text{ erg/s}$ , which can be parametrized as  $L_{\text{flare}} \sim 10^3 L_{\text{Edd}} \delta M_{\text{BBH}} = 90 M_{\odot} \text{P}$ , where  $L_{\text{Edd}}$  is the Eddington luminosity. If we parametrize the Bondi accretion rate onto the merged BH  $\dot{M}_{\text{BHL}}$  as

$$\dot{M}_{\text{BHL}} \sim \frac{0.03 M_{\odot}}{\text{yr}} \frac{M_{\text{BBH}}}{90 M_{\odot}}^2 \times \frac{v_{\text{rel}}}{200 \text{ km/s}}^{-3} \frac{\rho_{\text{disk}}}{10^{-11} \text{ g/cm}^3}; \quad \delta 4\text{P}$$

where  $\rho_{\text{disk}}$  is the disk gas density and we assume the relative velocity ( $v_{\text{rel}}$ ) between the BH and the AGN disk gas is  $v_{\text{rel}} \sim v_{\text{kick}}$ , i.e., the sound speed in the AGN disk gas is less than  $v_{\text{kick}}$ . We have chosen  $\rho_{\text{disk}}$  to be comparable to the typical density in a [116] model where the disk is near its thinnest (aspect ratio  $h \sim 10^{-3}$ ). Then  $L_{\text{flare}} \sim 10^{-2} L_{\text{BHL}}$ , where  $L_{\text{BHL}} \approx \dot{M}_{\text{BHL}} c^2$ . Interestingly, this accretion rate is within an order of magnitude of the inferred accretion rate onto embedded BBH in AGN from recent general relativistic magnetohydrodynamic simulations [119].

Associating the line asymmetry with an off-center flare implies that the signature persists in the BLR for  $\sim 70$  days postevent, but is gone  $\sim 90$  days postevent. A light-travel time across the full BLR of  $\sim 90$  days ( $\sim 80$  in rest frame), corresponds to a distance scale of  $0.07 \text{ pc} \sim 7 \times 10^7 r_g \delta M_{\text{SMBH}} = 2 \times 10^7 M_{\odot} \text{P}$ , implying that the merger occurred around  $4 \times 10^4 r_g \delta M_{\text{SMBH}} = 2 \times 10^7 M_{\odot} \text{P}$ . This is located further out than the thinnest

regions of a [117] model disk, so we can rule out an origin in a disk similar to that model. This location could be consistent with the thinnest ( $h \sim 10$ ) regions of a [116] model disk, which extend  $0.01$  to  $0.1$  pc.

An alternative candidate for an off-center luminous flare in an AGN is a  $\mu$ -TDE, where a star is tidally disrupted by a stellar mass BH embedded in an AGN disk. In [120] it is shown that, in the outer regions [ $\sim 7 \times 10 r_g \delta M_{\text{SMBH}} = 2 \times 10^7 M_{\odot}$ ] of a [116] disk model, a  $\mu$ -TDE will peak in afterglow very quickly (~hours), which is inconsistent with our observations. However, if  $M_{\text{SMBH}}$  is actually a factor of a few more massive, then the diffusion time becomes longer, potentially months, which could be consistent with our observations.

We also note that the light curve of AT 2023aagj resembles those of afterglows in AGN disks as found in [121]. The rise of an afterglow from a BBH merger is not implausible, assuming that these objects are able to launch jets, as explored by [35]. Future work could investigate the possibility of fitting those afterglow models in high-density environments.

Under the assumption that AT 2023aagj is the counterpart to S230922g, our requirements are that the AGN disk must be relatively thin, similar to a [116] model and that the accretion rate onto the kicked BH is significantly super-Eddington, but well below the Bondi rate (and requires an associated jet for the radiation to emerge). One of our most likely false positives for this event is a  $\mu$ -TDE in the disk if our estimate of  $M_{\text{SMBH}}$  is too small by a factor of a few.

## VI. CONCLUSIONS

In this work we present the results of the GW-MMADS follow-up of S230922g. We discuss in detail our most likely candidate AT 2023aagj, noting it is mostly constant blue color, AGN-hosted nature, and especially the presence of asymmetry in BLR spectral features as evidence in favor of recognizing it as a counterpart to S230922g; however, we do not find the current datasets sufficient to clearly identify the transient as such.

It is worth noting that several aspects lead to an inconclusive outcome regarding the significance of this association. The variable nature of the AGN in question, showing a significant flare in the infrared and a change in X-ray flux over the past decade, mandates the need for a disentanglement of the transient signal from coexistent AGN activity in order to confirm the counterpart as such. One possible discriminator is the observation of asymmetric components in the broad lines of the AGN spectrum, indicative of an off-center phenomenon; however, other sources such as disk winds and tilted dust obscuration may cause similar profiles. A smoking gun for the BBH association would be the evolution of the asymmetric component in sync with the transient light curve, with the asymmetry shifting toward bluer wavelengths and eventually disappearing as the transient fades. For AT

wavelength coverage for the Gemini spectrum and subsequentack of multiple observations of MgII, a chip gap on H $\beta$  in the Keck spectrum, the telluric region blueward of H $\alpha$ , and the target setting in December, the extraction of such an evolution is not feasible with the present data. A spectrum of this object in 2024 as the target rises again may be informative about the nature of the asymmetry. A persistent line asymmetry long after the merger event may point to similarly persistent asymmetric illumination in this source such as a warped disk, and could rule out the association between AT 2023aagj and S230922g. Finally, given the blue color and the ParSNIP prediction, we cannot exclude that this transient may have originated from a TDE.

We consider the uncertainty of our result as another indicator of the challenging nature of the search for BBH EM counterparts and successively the need for the continuation and growth of future efforts for this purpose. More so than for NS merger counterparts, predictions of BBH counterparts share a parameter space with existing transient families (e.g., that of TDEs) and AGN variability, and distinguishing between the different classes of events at the present time may be challenging. Spectroscopic data are expected to be the most helpful toward this end, and so it is important to combine the appropriate resources with photometric follow-up while transients are still active, for as long as it takes to develop models mature enough to perform well without requiring such expensive resources. This is especially relevant for the remainder of O4 follow-up, as all efforts made now will be the last for GW follow-up until the fifth gravitational wave observing run (O5) begins in 2027. With Virgo having joined the GW detector network for O4b, we expect future O4 searches to yield better localized events, a trend that is expected to continue with O5; these lower search volumes, in concert with forthcoming powerful resources such as Legacy Survey of Space and Time [122], will help future counterpart searches be more efficient and effective and will help deepen and broaden the impact of GW and multimessenger astronomy in the years to come.

Software used in generating data in this paper include the following: ASTROPY [123–125], DRAGONS [82], DUSTMAPS [70], GWEMOPT [61], HEALPY [126, 127], PPXF [84], Fritz SkyPortal [60], LIGO.SKYMAP [80], LPipe [81], Matplotlib [128], NumPy [129], Pandas [130], ParSNIP [78], PyRAF-DBSP [107], REDROCK [108], SExtractor [69], SFFT [68], and SWarp [131].

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## DATA AVAILABILITY

The data products and figure code for this publication are available at [132].

## APPENDIX: ADDITIONAL DATA

This section contains light curves (Figs. 5–8) and spectra (Fig. 9) for all candidates other than AT 2023aagj.

For some transients, we collected additional data with the Three Channel Camera [133] at the 2.1-m-Fraunhofer Wendelstein Telescope [134] located in the German alps. The instrument takes three images at the same time in two optical passbands and one near-infrared (NIR) band. For the monitoring of the transients, we used the g, i, and J bands. For the detrending of the images, the pipeline makes use of the tools from [135]. Then the images are calibrated and coadded using Extractor [136], SCAMP [137], and Warp [131], difference photometry is conducted with SFFT [68], and extinction corrections are applied as described in Sec. III A. During this process the astrometric solution is computed against the Gaia EDR3 catalog [138,139] and the zero points for the optical bands are calibrated with the PanSTARRS 1s (PS1s) catalog [140]. The NIR zero points are matched to the Two Micron All Sky Surveys catalog [73] and converted to AB magnitudes [141]. Wendelstein data are plotted as outlined diamonds in Fig. 5, with g, i, and J band data plotted in green, yellow, and red, respectively.

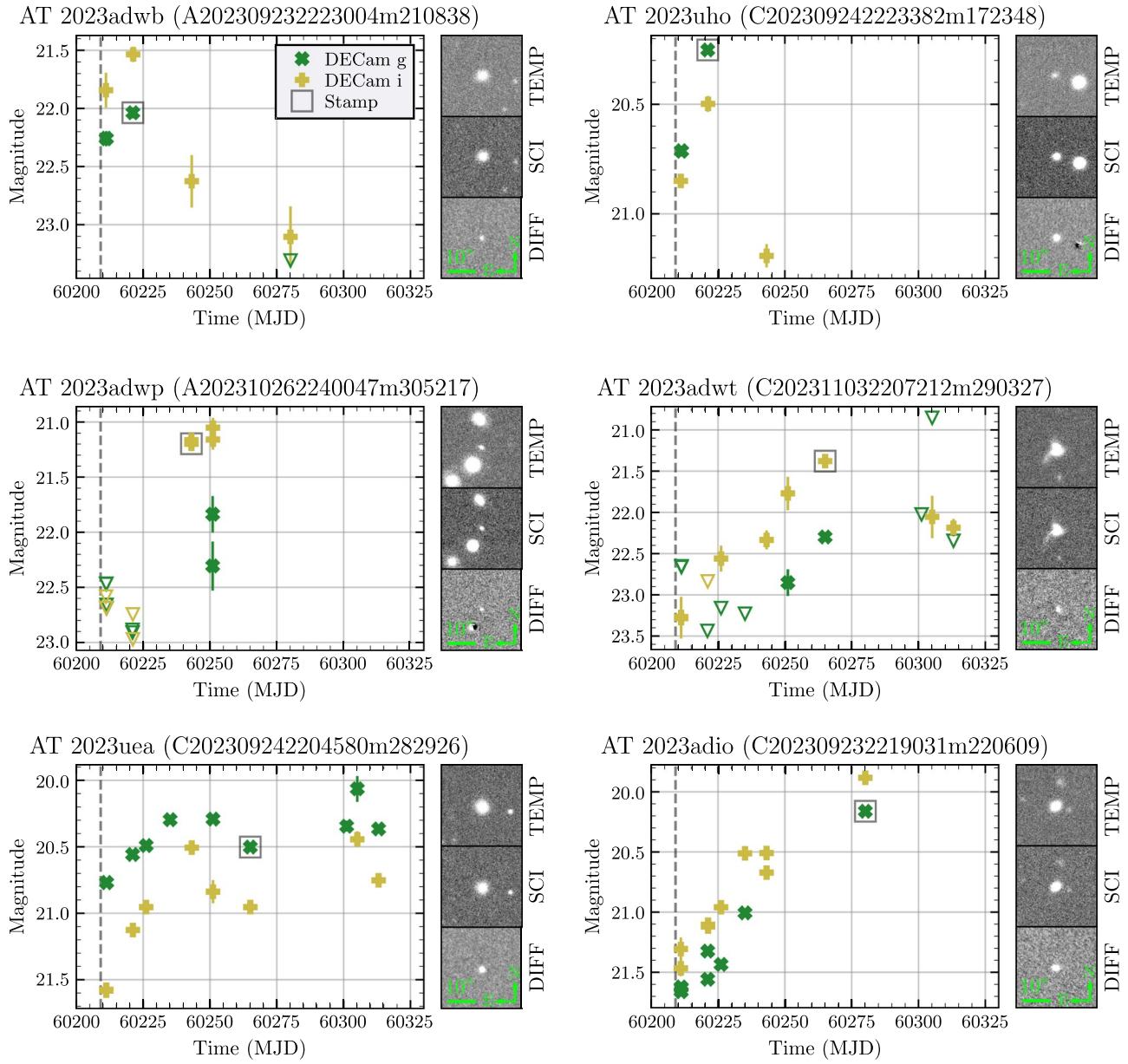


FIG. 5. Light curves for our remaining 22 candidates (continued in following figures). The dashed line indicates the S230922g event time. The sample stamps for each transient are taken from the exposure with the highest SNR, indicated with a gray square. Data taken with Wendelstein appear as small diamonds, where relevant (the red point for AT 2023uab is J band).

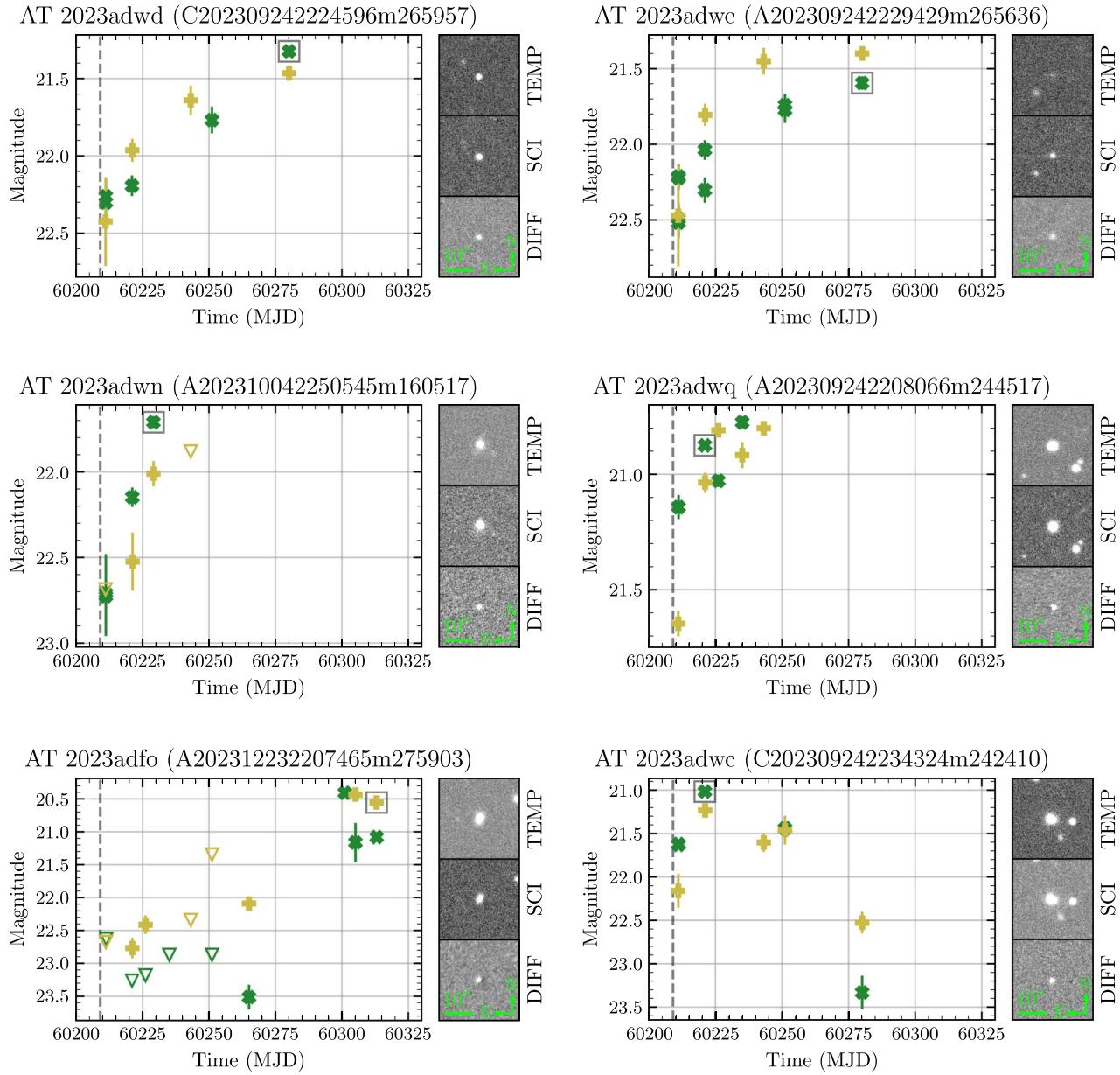


FIG. 6. Light curves for our remaining 22 candidates (continued).

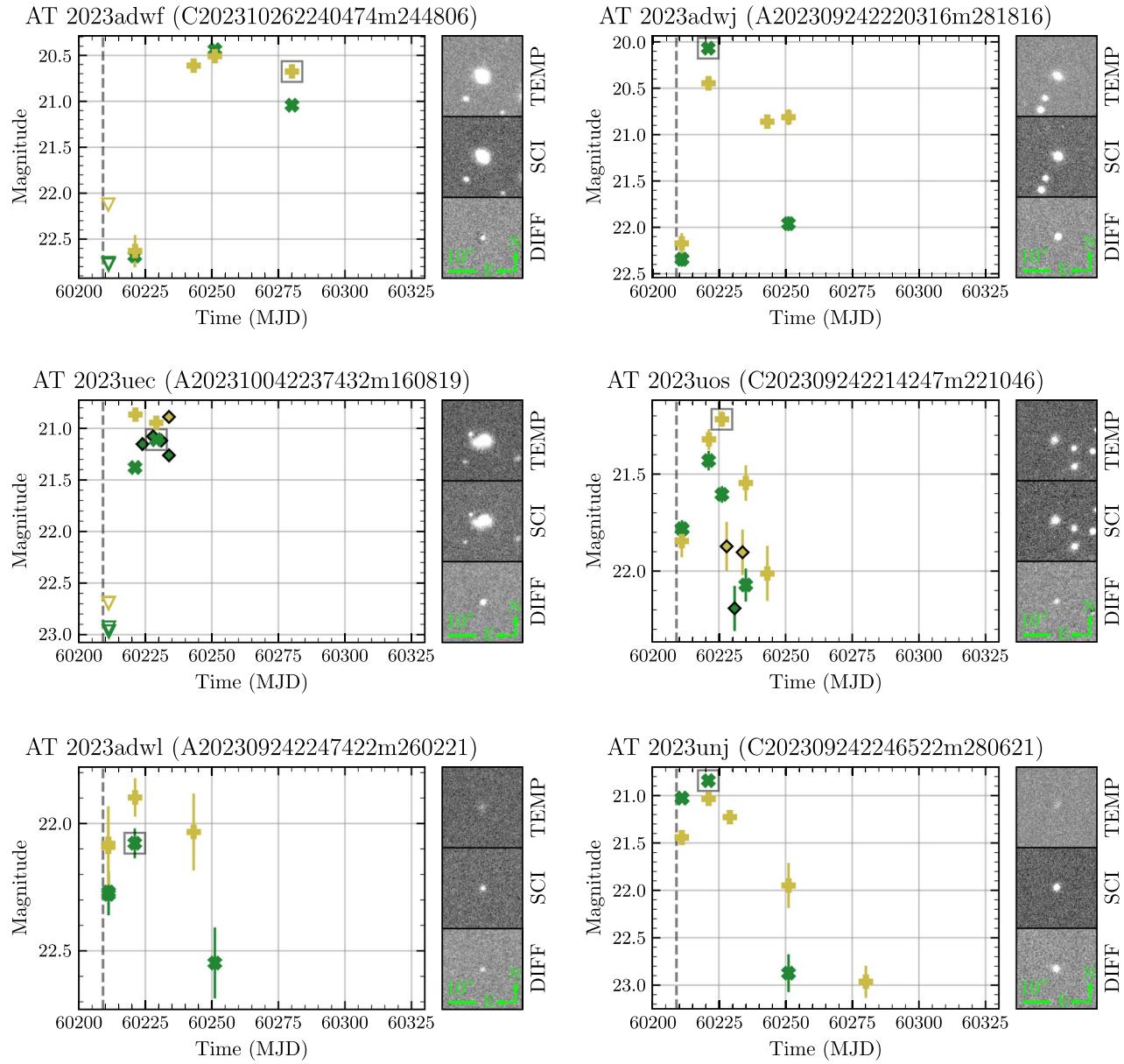


FIG. 7. Light curves for our remaining 22 candidates (continued).

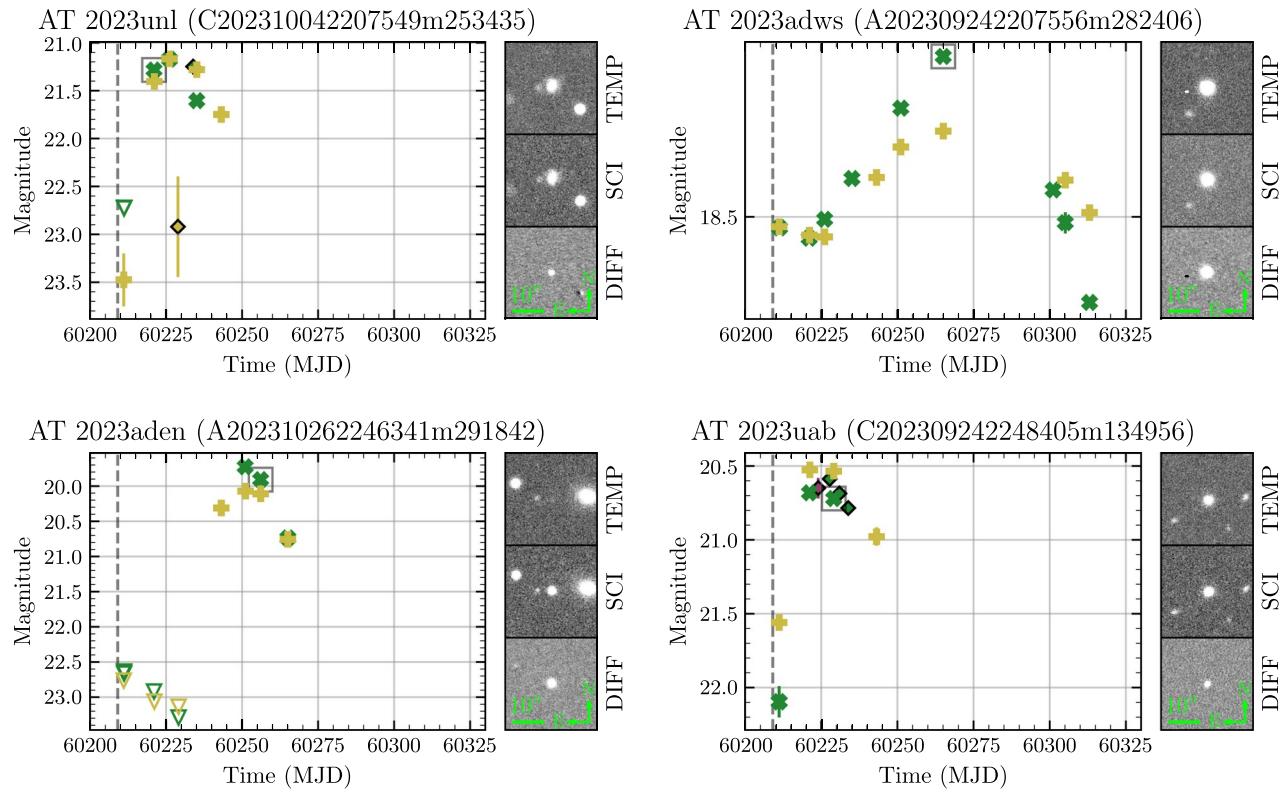


FIG. 8. Light curves for our remaining 22 candidates (continued).

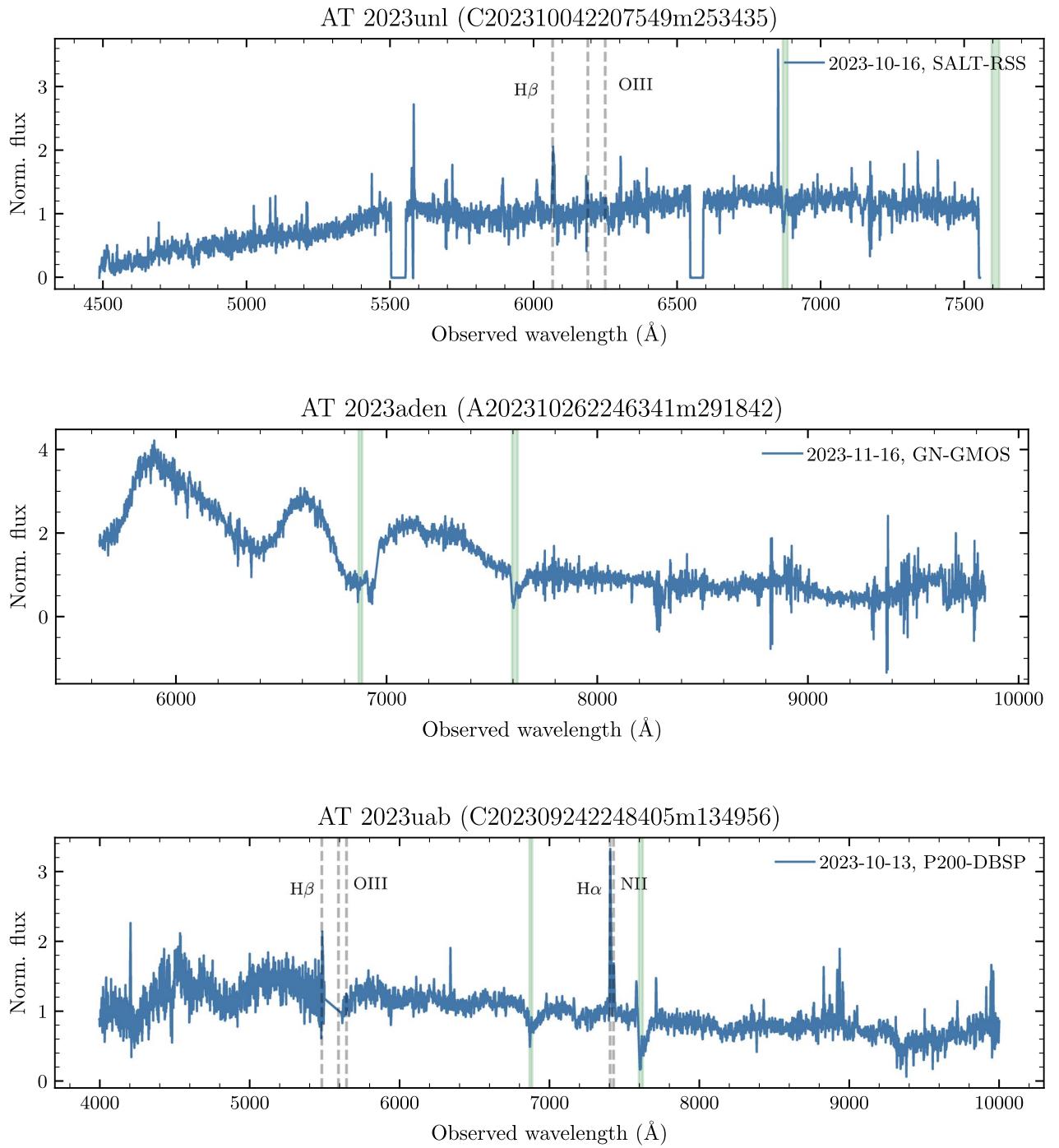


FIG. 9. Additional spectra taken as a part of our follow-up campaign. A selection of spectral lines and telluric features are marked as Fig. 3.

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