# DECAM-GROWTH SEARCH FOR THE FAINT AND DISTANT BINARY NEUTRON STAR AND NEUTRON STAR-BLACK HOLE MERGERS IN O3A

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### RESUMEN

Las búsquedas sinópticas de contrapartidas ópticas resultantes de la fusión de un sistema binario compuesto por dos estrellas de neutrones (BNS) o un agujero negro y una estrella de neutrones (NSBH) puede resultar en resultados muy significativos en relación al descubrimiento de kilonovas en el contexto de la Astronomía de multimensajeros. En este trabajo, describimos la ventaja de una red global de telescopios para este fin, haciendo énfasis en el instrumento DECam (Cámara para la Energía Oscura) en este contexto. Describimos la aplicación web Marshal para la observación en modo de oportunidad de los fenómenos transitorios que se suceden (GROWTH) como una aplicación web común diseñada para aceptar eventos, planificar observaciones, buscar candidatos transitorios y realizar un sumario de todas las observaciones realizadas para cada evento. Nuestra infraestructura nos permitió realizar observaciones de dos alertas de ondas gravitacionales acontecidas durante el periodo O3a: S190426c y S190510g. Del análisis de las observaciones profundas realizadas con DECam de S190814bv conducido por el equipo de DESGW, en conjunción con el acceso a una variedad de instalaciones de astronómicas, se pusieron restricciones significativas en los parámetros de la kilonova y el sistema binario que hubiera dado lugar a ella. Destacamos la importancia de una red global de telescopios en conjunto con un potente sistema como DECam en el desempeño de la búsqueda de las contrapartidas de las fuentes de ondas gravitacionales.

### ABSTRACT

Synoptic searches for the optical counterpart to a binary neutron star (BNS) or neutron star-black hole (NSBH) merger can pose significant challenges towards the discovery of kilonovae and performing multi-messenger science. In this work, we describe the advantage of a global multi-telescope network towards this end, with a particular focus on the key and complementary role the Dark Energy Camera (DECam) plays in multi-facility follow-up. We describe the Global Relay of Observatories Watching Transients Happen (GROWTH) Target-of-Opportunity (ToO) Marshal, a common web application we built to ingest events, plan observations, search for transient candidates, and retrieve performance summary statistics for all of the telescopes in our network. Our infrastructure enabled us to conduct observations of S190814bv conducted by the DESGW team, and access to a variety of global follow-up facilities allowed us to place meaningful constraints on the parameters of the kilonova and the merging binary. We emphasize the importance of a global telescope network in conjunction with a power telescope like DECam in performing searches for the counterparts to gravitational-wave sources.

Key Words: gravitational waves — methods: data analysis — stars: neutron — surveys — telescopes

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#### 1. INTRODUCTION

The direct detection of gravitational wave (GW) signals and the discovery of their electromagnetic (EM) counterparts opened a new era for multimessenger astrophysics. The combined discovery of a GW event and associated EM transients can lead to a watershed of science, for example providing insights into heavy-element nucleosynthesis, neutron star (NS) equation of state, relativistic jet physics, stellar evolution, tests of general relativity, and cosmology. In 2017, the identification and follow-up of an EM counterpart to the nearby GW170817 event proved the benefit of multi-wavelength followup from radio to gamma-rays (Abbott et al. 2017a,b; Goldstein et al. 2017; Coulter et al. 2017; Hallinan et al. 2017; Evans et al. 2017; Kasliwal et al. 2019b; Troja et al. 2017; Margutti et al. 2017; Haggard et al. 2017). Prompt optical and near-infrared (IR) observations can lead to the sub-arcsecond localization of a transient called "kilonova" (KN) or "macronova" (e.g. Nakar 2019) associated with the the GW source. Accurate luminosity distances can then be measured with spectroscopic follow-up of the kilonova and its host galaxy.

The third LIGO-Virgo-KAGRA observing run (O3) started in April 2019 and it is expected to conclude in May 2020. Open alerts are made available to the community upon GW discovery, which enables immediate EM follow-up. Several reasons concur to make rapid follow-up necessary, including i) the optical/infrared counterpart, if exists, is expected to fade significantly in hours to days; ii) early detection can enable extensive spectroscopic and photometric multi-wavelength follow-up; 3) even in the case of GW170817, the beginning of the light curve evolution was not well understood and only observations within < 10 hours can help break the degeneracy between models (e.g. Kasliwal et al. 2017; Drout et al. 2017; Waxman et al. 2018; Piro & Kollmeier 2018; Arcavi 2018).

Global Relay of Observatories Watching Transients Happen (GROWTH) is a network of partner institutions and telescopes around the world aimed at obtaining continuous follow-up of various kinds of fast transients. In the context of the search for electromagnetic counterparts to gravitational waves, our network consists of a number of "search" telescopes capable of conducting galaxy-targeted and synoptic searches for gravitational waves, including the Zwicky Transient Facility (ZTF; Bellm et al. 2019), the Dark Energy Camera (DECam; Flaugher et al. 2015), Palomar Gattini-IR (De et al. 2020; Moore & Kasliwal 2019), Kitt Peak EMCCD Demonstrator (KPED; Coughlin et al. 2019), and GROWTH-India telescope (GIT<sup>13</sup>). The majority of the other facilities in our network obtain photometric and spectroscopic follow-up of transient candidates identified during the searches within the GW localization.

O3 has yielded more than 53 events from its start to March 2020, with several binary neutron star (BNS) and neutron star-black hole (NSBH) mergers that may be accompanied by EM counterparts. However, no counterpart to a GW signal has been identified during O3 (see for example Antier et al. 2020; Gompertz et al. 2020, Kasliwal et al. 2020, in prep). The search for an optical counterpart to mergers with at least 1 NS is particularly challenging during O3, mainly because of the large sky areas to cover (with a median 90% integrated probability region of  $\sim 3400 \text{ deg}^2$ , for BNS and NSBH), disjoint skymaps where high-probability lobes are located far apart from each other, and large estimated distances (usually > 200 Mpc). Both galaxy-targeted and synoptic follow-up strategies were used by astronomers during O3. Here we present how the GROWTH collaboration plans and conducts multi-facility followup of GW triggers. In particular we describe the custom software that we created for multi-telescope observation scheduling and we present the DECam-GROWTH project, which uses the wide-field Dark Energy Camera for deep, synoptic follow-up of NS mergers.

#### 2. THE GROWTH NETWORK

#### 2.1. GROWTH Target-of-Opportunity Marshal

To facilitate the rapid and coordinated follow-up of transient events localized to large sky regions, such as Gamma Ray Bursts (GRBs), GWs, and neutrinos, as soon as the skymaps are distributed via GCN notice and become visible at our observatory sites, we developed the GROWTH Target-of-Opportunity (ToO) Marshal<sup>14</sup> (Kasliwal et al. 2019a). The GROWTH ToO marshal is a Flask-based web application, built on a postgresql database, relying on celery for the management of an asynchronous task queue to handle long-term background jobs. ligo.skymap<sup>15</sup>, an open-source software for processing and manipulating gravitational-wave localizations, is a key component of the ToO Marshal. The GROWTH ToO Marshal automatically ingests all GCN notices and displays them on the front page; users can navigate to a given event and generate dif-

<sup>&</sup>lt;sup>13</sup>https://sites.google.com/view/growthindia/.

 $<sup>{}^{14} \</sup>rm https://github.com/growth-astro/growth-too-marshal\,.$ 

 $<sup>^{15} \</sup>rm https://github.com/lpsinger/ligo.skymap$  .

ferent potential observing plans to either tile the localization or perform galaxy-targeted follow-up. The backend for scheduling is handled by Gravitational-Wave ElectroMagnetic Optimization (gwemopt <sup>16</sup>; Coughlin et al. 2018), another open-source codebase used to apply algorithms for tiling, time allocation, and scheduling to facilitate planning observations within a skymap.

The ToO marshal's key functionalities include:

- 1. Automatically ingesting GCN notices from GRB, GW, and neutrino alerts
- 2. Notifying astronomers (via phone call and text message) when a multi-messenger event, worthy of follow-up, has been detected
- 3. Displaying classification and source properties of all ingested events
- 4. Facilitating observing plan generation through a variety of customizable settings
- 5. Visualizing proposed plan via data tables (containing probability coverage and total time) and planned pointings onto the skymap
- 6. Allowing users to directly trigger the telescope queue
- 7. Generating tables containing all galaxies falling within the 90% credible volume
- 8. Querying our GROWTH Marshal database (Kasliwal et al. 2019a) for saved transient candidates falling within the 2D skymap
- 9. Retrieving completed observations and calculating statistics for the GCN (such as probability, coverage, and median depth)

Here, we highlight the importance of our ToO Marshal in handling multi-telescope scheduling from a common platform. This enables efficient and coordinated planning for conducting observations within the skymap, where the observation plans from different telescopes can complement one another. We demonstrate examples of complementary telescope follow-up between DECam, ZTF, Gattini-IR, and GROWTH-India in Figures 1 and 4.

### 2.2. DECam in the GROWTH network

The Dark Energy Camera (DECam, Flaugher et al. 2015) is a  $3 \text{ deg}^2$  FOV imager mounted on the 4m-class Blanco telescope, a member of the Cerro

Tololo Inter-American Observatories in Chile. With its relatively wide field of view and high sensitivity, DECam is an excellent instrument for GW follow-up observations, as demonstrated during LIGO/Virgo O2 (Soares-Santos et al. 2016; Cowperthwaite et al. 2016) which culminated with GW170817 (Soares-Santos et al. 2017; Cowperthwaite et al. 2017).

In 2018 and 2019 our DECam-GROWTH team was granted time for target-of-opportunity (ToO) observations for the follow-up of BNS and NSBH events detected by LIGO (PIs Igor Andreoni and Danny Goldstein; "Public DECam Follow-up of Neutron Star Mergers During O3"; NOAO proposal IDs 2018B-0942, 2019A-0205, 2019B-0353). We specifically requested that our data be immediately made public after it was taken. As an outcome of the time allocation process, data acquired by all teams who were granted ToO triggers with DECam for the follow-up of GW events were made immediately public during O3.

While ZTF is capable of mapping sky regions spanning thousands of square degrees in tens of pointings due to its massive footprint, its limiting magnitude hinders ZTF from achieving the necessary depth to follow-up distant GW events, and the limited filter coverage (q and r, in O3a) are not the most optimal for the discovery of early-time kilonova emission. DECam, while suited for searches spanning a few hundreds of square degrees with its fieldof-view and slew rate, is primed for following up the most distant GW events as it is capable of achieving a  $3\sigma$  magnitude of r > 22.3 mag in 40 second exposures, as demonstrated in Andreoni et al. 2019a. The wider range of filters it offers (including q, r, i, and z) compared to ZTF can contribute towards capturing the intra- and inter-night color evolution of a kilonova (Flaugher et al. 2015). By coordinating observations between DECam and ZTF using methods described in Coughlin et al. 2019, the GROWTH team can continue to map very large sky regions with ZTF while performing deep searches within the highest probability region with DECam.

### 3. DECAM-GROWTH FOLLOW-UP OF O3A EVENTS

During the first half of O3, we triggered the DECam-GROWTH program twice for the follow-up of S190426c and S190510g. For other two events, S190728q and S190814bv, DECam was triggered and operated by the DESGW team; we ran our image-processing pipeline and conducted analyses based on the follow-ups. A summary of our observations is

<sup>&</sup>lt;sup>16</sup>https://github.com/mcoughlin/gwemopt.



Fig. 1. Screenshots from the GROWTH ToO Marshal, displaying the event page, and the plan page. These screenshots feature S190426c, the first event during O3a that we triggered DECam on. Left: the event page, used to display properties of each ingested GCN notices ascribed to S190426c, and to show the observability of the skymap as a function of time from each of our GROWTH search telescopes; Right: disjointed BAYESTAR skymap for S190426c - DECam planned pointings (shown in circles) cover the entire Southern lobe and the lower portion of the Northern lobe, ZTF planned pointings cover most of the Northern lobe (aside from the Northern polar cap, where it lacked reference coverage, at the time) and Gattini planned pointings cover the entire Northern lobe, including the polar cap. The dialogue box shown in the righthand side portion of the figure displays the right ascension, declination, DECam field id, and DECam reference depth in different filters for a given DECam tile intersecting with the localization.

given in Table 1. In these proceedings, we do not discuss S190728q as it was officially classified as a binary black hole, and is unlikely to have an associated EM counterpart. We describe the remaining three on an event-by-event basis, below. As described in Sec. 2.1, all of our triggered observations were planned and executed using the GROWTH ToO Marshal. Our nominal observing strategy for following up BNS localized to within  $150 \text{ deg}^2$  and within 200 Mpc is to conduct three epochs consisting of q-z-q observations on the first night, and q-z observations on the second night. This filter combination is primed to detect the fast blue optical emission expected for a GW170817-like kilonova and to single out a kilonova based on its rapid color evolution. We performed image differencing for all of these followups using an automated real-time image processing and image subtraction pipeline (Goldstein et al. 2019b). The pipeline launches a c5.18xlarge spot EC2 instance with 72 vCPUs and 144 GB of RAM for every exposure. The pipeline astrometrically and photometrically calibrates images in parallel, creates references, performs image subtractions, identifies candidates, filters them using autoScan (Goldstein et al. 2015) and performs aperture photometry. Each exposure takes  $\sim 20$  minutes to process. This image processing pipeline, the central engine powering our searches, runs now on Amazon Web Services Elastic Compute Cloud (EC2); the results of the pipeline are stored on Amazon Simple Storage Service (S3). A more complete and extensive description of the image processing and subtraction pipeline can be found in Goldstein et al. 2019b. The reference templates for the imaged regions were drawn from three publicly available DECam datasets: Dark Energy Survey DR1 (Abbott et al. 2016, 2018), DE-Cam Legacy Survey (Dey et al. 2019), and BLanco Imaging of the Southern Sky (BLISS; Soares-Santos et al. 2017). Table 1 summarizes the follow-ups performed with DECam via the DECam-GROWTH and DESGW programs (Goldstein et al. 2019b; Andreoni et al. 2019a; Soares-Santos et al. 2019c; Herner et al. 2019b,a; Soares-Santos et al. 2019a,b; Andreoni et al. 2020b).

#### DECAM-GROWTH FOLLOW-UPS IN O3A



Fig. 2. A screenshot of our planning page, used to create customized observation plans for each skymap and telescope. Some scheduling features we highlight here, that we have frequently used in our follow-up observations, include the greedy-slew algorithm that down-weights large slews when scheduling observations, filter balancing, to facilitate multiepoch scheduling of the skymap, the ability to slice skymaps by right ascension, for better handling of disjointed skymaps. These features, as well as a few others, are described in more detail in AlMualla et al. 2020, in prep.

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LCRS B110936.7-032024	168.0400	-3.6121	139.49	0.19		94.69		LEDA 1278240	322.749084	5.10861		0.0709
LCRS B110853.0-025429	167.8582	-3.1795	169.87	0.19		94.69		LEDA1285289	322.821228	5.553754		0.08506
LCRS B110836.9-031253	167.7908	-3.4866	144.78	0.19		94.69		SDSSJ213208	323.034882	4.482058		0.0729
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Fig. 3. Screenshots from the GROWTH ToO Marshal, displaying our galaxies and objects pages for S190426c. Left: table containing eight galaxies falling within the 90% credible volume of the 3D skymap; Right: table containing a subset of the objects falling within the 90% credible region of the 2D skymap.

### 3.1. $S190426c^{17}$

Initially classified as a binary neutron star merger, with descending probabilities of MassGap, neutron star-black hole (NSBH), and terrestrial, S190426c (LIGO Scientific Collaboration and Virgo Collaboration 2019a) was of interest to our DECam-GROWTH program, as it was the first potential NSBH of O3. Part of the skymap, initially spanning 1262 deg<sup>2</sup>, was accessible with DECam. We generated a plan based on the greedy scheduling algorithm, with an integrated filter strategy that

<sup>&</sup>lt;sup>17</sup>For more details, see Goldstein et al. 2019b.

TABLE 1

SUMMARY OF THE DECAM-GROWTH <sup>*</sup>										
event	classification	loc. area	distance	coverage	prob	depth	$\mathbf{p}_t$			
S190426c	NSBH	1131	$377 \pm 100$	525	0.08	22.9	14%			
S190510g	BNS	1166	$227\pm92$	249	0.62	23.1	58%			
S190728q	BBH	104	$874 \pm 171$	108	0.81	23.0	$<\!1\%$			
S190814bv	NSBH	23	$267\pm52$	64	0.98	21.0	< 1%			

<sup>\*</sup>(Goldstein et al. 2019; Andreoni et al. 2019; Andreoni et al. 2020) and DESGW (Soares-Santos et al. 2019a,b,c; Herner et al. 2019a, b) follow-up observations of LIGO detections during O3a. We log each event, its highest probability classification, localization area (deg<sup>2</sup>), median distance (Mpc), DECam area coverage (deg<sup>2</sup>), DECam probability coverage, median depth, and probability of the event being terrestrial ( $p_t$ ).



Fig. 4. In contrast to Figure 1 which shows an example of the planned pointings with the GROWTH telescope network, this figure highlights our actual completed observations within the skymap of S190426c with ZTF, Palomar Gattini-IR, DECam, and GROWTH-India. The lefthand side shows a globe with the skymap of S190426c projected onto it. The inset panels, from top to bottom, show 1) the initial BAYESTAR localization, 1.1 hours after the merger, 2) a tiled coverage of the highest probability patch in the skymap by the GROWTH-India telescope in the r-band to a depth of r < 20.6 3) observations by Gattini-IR of most of the Northern portion of the skymap to J < 16.2mag, 4) DECam coverage of the bottom portion of the Northern lobe, and Southern lobe to r < 23.4mag, z < 22.5mag, 5) ZTF observations of parts of the Northern and Southern lobe to a depth of q < 21.7mag, r < 21.7mag. Unfortunately, the localization shifted the probability away from the regions observed by DECam 20.5 hours after the merger, as shown as inset panel 6.

would conduct observations in r and z, redder bands than the nominal strategy to detect the hypothesized emission from a NSBH merger. Triggering observations starting at 2019-04-26 22:57:35 UT and ending at 2019-04-27 10:25:54 UT, we covered a total of 525 deg<sup>2</sup> and 16% probability in the BAYESTAR skymap to limiting magnitudes of 22.5 mag in z and 22.9 mag in r. The updated LALInference skymap released the following night eliminated the probability in the regions we had already observed, so we did not trigger any further ToO observations. We identified a handful of candidates from our initial observations using the image subtraction pipeline that were systematically ruled out, or shown to be excluded from the updated LALInference map (LIGO Scientific Collaboration and Virgo Collaboration 2019b).

In Figure 4, we highlight the importance of having a network of search telescopes in order to perform continuous and complementary follow-up of GW skymaps, aided in a large part by our GROWTH ToO Marshal. During our observational campaign of S190426c, we covered > 90% of the probability in the skymap using the joint observations from four telescopes. The sequence of the observations was determined by the time at which the observable portions of the skymap was visible from each telescope site.

# $3.2. S190510g^{18}$

Within a 15 day timespan, the LIGO+Virgo detector network observed another BNS merger candidate, S190510g, spanning  $3462 \text{ deg}^2$ , with a distance of  $269 \pm 108$  Mpc in the BAYESTAR skymap (The LIGO Scientific Collaboration and the Virgo Collaboration 2019). Given the BNS classification, combined with the high distance, we triggered our DECam follow-up program. DECam imposes a strict engineering constraint on the hour angle of the telescope as a function of the declination; when attempting to address the hour angle limit, we discovered that scheduling observations using the default greedy algorithm introduced large slewing overheads into our plan. Thus we implemented a modified version of the greedy scheduling algorithm to down-weight large slews, and used this to schedule our observations of this event. We began our observations at 2019-05-10 06:00:25 UT, three hours after the merger, adopting a q-z strategy for KNe from BNS mergers. Only one part of the skymap was above the horizon, as it was already Chilean night-time.

<sup>&</sup>lt;sup>18</sup>For more details, see Andreoni et al. 2019a.

Due to an unexpected system failure that night, we ran into the hour angle limit, and could only cover  $\sim 15\%$  probability in g and 10% in z. Before our second night of observations, LIGO+Virgo released an updated LALInference skymap (The LIGO Scientific Collaboration and the Virgo Collaboration 2019b), shifting the probability from the two equatorial patches we observed to one patch at  $-30^{\circ}$  declination, with the inner 50% contour spanning only  $31 \text{ deg}^2$ . Focusing on the highest probability patch, we conducted observations in q-z-r; since it was the second night after merger, the q-z color combination would allow us to probe a fast blue KN component if it existed, while checking for redder emission detectable in the *r*-band. Employing this strategy, we covered a total of 67% probability over three filter epochs. After our observations ended, the LVC reclassified this event as having 58% terrestrial probability and the remainder BNS (The LIGO Scientific Collaboration and the Virgo Collaboration 2019a). Nevertheless, we employed our DECam image processing pipeline described earlier to identify candidates and reduced the set of over 150,000 transients to 12 viable counterpart candidates which we reported via GCN, although none of the candidates looked promising enough to be a KN. Comparing our upper limits against a set of existing kilonova models (Bulla 2019), we demonstrate that with our observations, if this event was astrophysical, we would have detected a GW170817-like KN if it fell within the observed region at the median distance of this event, and at favorable viewing angles (see Figure 4 in Andreoni et al. 2019a).

## 3.3. $S190814bv^{19}$

With a 90% localization of just 23  $deg^2$  and an extremely low false alarm rate of  $\sim 1/10^{25}$  years, S190814by is the most well-localized, high significance event amongst the BNS and NSBH merger candidates detected by LIGO during O3. As its initial classification was MassGap, it fell under the purview of the DESGW program 2019B-0372 (PI: Soares-Santos; Soares-Santos et al. 2016), rather than our DECam-GROWTH program. The DESGW team triggered ToO observations of DE-Cam starting on 2019-08-15 06:32:43 UTC, and tiled the 98% credible region 10 times over the course of 6 Chilean calendar nights (2019-08-14, 2019-08-15, 2019-08-16, 2019-08-17, 2019-08-20, 2019-08-30), increasing the searched depth with subsequent nights of observations. Observations were carried out in the i and z filters in order to capture the rapid reddening expected of a kilonova from a NSBH merger. During each night of observations planned and executed by the DESGW team, we retrieved the publicly available data and vetted candidates discovered by our automated image processing pipeline. Due to the  $5\sigma$  photometric limiting depth of the observations over the six nights ranging from i=21.1-24.1and z=20.9-23.2, we limited our analysis to the  $\pm 2\sigma$ distances quoted for the event. In practice, this involved employing the Photometric Redshift Legacy Survey catalog (PRLS; Zhou et al. 2020) to estimate the photometric redshifts of candidates with a host galaxy and reject candidates falling outside the  $\pm 2\sigma$ LVC distance. We reported all candidates of interest identified during the vetting procedures via GCN. Our analysis yielded seven significant candidates of interest with initial discovery by DECam or ZTF, for which we obtained photometric and spectroscopic follow-up (Andreoni et al. 2020b); in addition to these, we followed up three candidates identified by DESGW and Pan-STARRS teams (Herner et al. 2019a; Soares-Santos et al. 2019a,b; Srivastav et al. 2019). The most promising KN counterpart candidate amongst these was DG19wxnjc/AT2019npv (Goldstein et al. 2019a), whose initial detections in optical and NIR bands, reddening rate  $\delta(i-z) \sim 0.05$ mags/day and subsequent non-detection  $5\sigma$  limit of J=21.4 mag made for a convincing case. On 2019-08-24 we obtained one NIR spectrum with Keck II+NIRES that appeared mostly featureless, with He I features at the redshift of the host galaxy, demonstrating that the candidate was a SN Ib/c (See Figure 2 of Andreoni et al. 2020b); Gomez et al. 2019 confirmed the classification as a SN Ic. The remaining significant candidates were either classified as supernovae or shown to have pre-detections in other surveys, excluding the possibility that they could be associated with S190814bv.

As a result of the well-cadenced, deep synoptic limits placed on the KN emission of a potential counterpart of S190814bv by these DECam observations, we were able to place significant constraints on the parameters of the merging system, if indeed there was a detectable optical/NIR counterpart within the 23 deg<sup>2</sup> localization. First, we consider 2D kilonova models obtained with the radiative transfer code **possis** (Bulla 2019) which are parameterized in terms of the ejecta mass  $M_{ej}$ , half-opening angle of the equatorial lanthanide-rich component  $\phi$ , and the viewing angle  $\theta_{obs}$ . We select  $\phi = 15^{\circ}$  and  $\phi = 30^{\circ}$  as the values for our ejecta half-opening angles, based on previous numer-

<sup>&</sup>lt;sup>19</sup>For more details, see Andreoni et al. 2020b.

ical simulations (Kawaguchi et al. 2016; Fernández et al. 2019). For reference, the model best-matching with GW170817 has  $\phi = 30^{\circ}$ ,  $M_{ej} = 0.05 M_{\odot}$ , and  $\cos \theta_{obs} = 0.9$  (Dhawan et al. 2019). In Figure 5 of Andreoni et al. 2020b, the top panel displays the lightcurve models that can be ruled out for these two opening angles based on the upper limits in i and zbands over the six nights of observations. The bottom panel of the figure demonstrates the regions of  $M_{ei}$ - $\theta_{obs}$  parameter space that are allowed and disallowed based on the non-detection upper limits. The brighest kilonovae, with polar viewing angles (faceon,  $\theta_{obs}=0.0$ ) are ruled out by the DECam observations for any distance assumption. However, only when assuming the closest distance, a polar viewing angle, and a half-opening angle of  $15^{\circ}$  can one place the most stringent constraints on ejecta mass  $(M_{ei} < 0.05 M_{\odot})$ ; for more conservative distances, viewing angles, and half-opening angles, we set the constraint that  $M_{ei} < 0.10 M_{\odot}$ . Overall, the limits are most constraining when a nearby distance (light blue) is assumed for the event; we see that deeper observations earlier on would have placed more stringent constraints on the kilonova parameters.

In Figure 6 of Andreoni et al. 2019a, we assume a different kilonova model with spherical ejecta with a density profile  $\rho \alpha v^{-n}$ ; the resulting kilonova models rely on a heating rate formalism described in Hotokezaka & Nakar 2019. By using these models to constrain the  $\kappa$ -M<sub>ej</sub> (opacity - ejecta mass) space, we find that a KN associated with S190814bv cannot have a lanthanide-poor ejecta mass component that is  $> 0.05(0.03) M_{\odot}$  if the merger occurred at 267 (215) Mpc. The shaded regions in the figure correspond to regions of parameter space where the KN lightcurve models are brighter than our DECam upper limits at the assumed distance. These results are roughly consistent with the results obtained using the **POSSIS** lightcurves, under favorable viewing angles.

Finally, synthesizing our constraints on the ejecta mass from both sets of KN models, we translate them to constraints on the merging binary system, contingent upon a set of assumptions. Figure 7 of Andreoni et al. 2020b displays the constraints on the maximum aligned spin for various combinations of mass ratio between the neutron star and black hole, and the tidal deformability of the neutron star, for  $M_{ej} < 0.03 M_{\odot}$ . Assuming 1) a dimensionless tidal deformability for GW170817, where compactness of a star decreases with increasing  $\Lambda_{NS}$ , 2)  $M_{ej} < 0.03 M_{\odot}$ , based on the KN models from Hotokezaka & Nakar 2019, assuming the closest distance of 215 Mpc and 3) aligned spin between the neutron star and black hole, the data constrain the maximum aligned spin of the black hole to have  $\chi_{BH} < 0.7$  for mass ratios > 6.

We note that, considering the non-detection of a counterpart to S190814bv in the deep synoptic DECam follow-ups performed, we cannot exclude the possibility that S190814bv may also be a binary black hole merger or a NSBH merger system with a very large mass ratio, such that the NS plunged directly into the black hole.

#### 4. SUMMARY

Automatic telescope scheduling is crucial for the discovery of EM counterparts to GW sources. Here we presented the GROWTH ToO Marshal platform used to dynamically schedule multi-messenger follow-up with 5 telescopes, including ZTF, DECam, Gattini-IR, GROWTH-India, and KPED. DECam is a strong asset in contributing to the EM follow-ups of GW events in conjunction with the GROWTH network for conducting extensive searches within GW skymaps, due to its location in the Southern hemisphere, its deep sensitivity, and multi-band coverage. However, DECam excels particularly in the follow-ups of distant, well-localized events, such as S190814bv; deep and targeted DECam follow-ups of S190814bv enabled us to place meaningful constraints on kilonova parameter space and binary properties, even given non-detection of a kilonova.

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