

GWTC-2: Compact Binary Coalescences Observed by LIGO and Virgo During the First Half of the Third Observing Run

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We report on gravitational wave discoveries from compact binary coalescences detected by Advanced LIGO and Advanced Virgo in the first half of the third observing run (O3a) between 1 April 2019 15:00 UTC and 1 October 2019 15:00 UTC. By imposing a false-alarm-rate threshold of two per year in each of the four search pipelines that constitute our search, we present 39 candidate gravitational wave events. At this threshold, we expect a contamination fraction of less than 10%. Of these, 26 candidate events were reported previously in near real-time through GCN Notices and Circulars; 13 are reported here for the first time. The catalog contains events whose sources are black hole binary mergers up to a redshift of ~ 0.8 , as well as events whose components could not be unambiguously identified as black holes or neutron stars. For the latter group, we are unable to determine the nature based on estimates of the component masses and spins from gravitational wave data alone. The range of candidate event masses which are unambiguously identified as binary black holes (both objects $\geq 3 M_{\odot}$) is increased compared to GWTC-1, with total masses from $\sim 14M_{\odot}$ for GW190924_021846 to $\sim 150M_{\odot}$ for GW190521. For the first time, this catalog includes binary systems with significantly asymmetric mass ratios, which had not been observed in data taken before April 2019. We also find that 11 of the 39 events detected since April 2019 have positive effective inspiral spins under our default prior (at 90% credibility), while none exhibit negative effective inspiral spin. Given the increased sensitivity of Advanced LIGO and Advanced Virgo, the detection of 39 candidate events in ~ 26 weeks of data (~ 1.5 per week) is consistent with GWTC-1.

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I. INTRODUCTION

Since the discovery of gravitational waves from a binary black hole (BBH) coalescence in 2015 [1], the Advanced LIGO [2] and Advanced Virgo [3] gravitational wave detectors have opened a new window on our Universe [4–8]. Binary black hole observations have allowed us to probe gravity in the strong-field regime [9, 10] and to establish the rate and population properties of BBH coalescences [11]. In addition to BBHs, Advanced LIGO and Advanced Virgo detected the first gravitational wave signal from a binary neutron star (BNS) coalescence, GW170817 [12], which was also the first joint detection of gravitational waves and electromagnetic emission [13, 14]. Gravitational wave discoveries have had a profound impact on physics, astronomy and astrophysics [13, 15–19], and the public release of LIGO and Virgo data [20, 21] has enabled groups other than

the LIGO Scientific Collaboration and Virgo Collaboration (LVC) to perform analyses searching for gravitational wave signals [22–28] and to report additional candidate events in some cases.

We present the results of searches for compact binaries in Advanced LIGO and Advanced Virgo data taken between 1 April 2019 15:00 UTC and 1 October 2019 15:00 UTC. This period, referred to as O3a, is the first six months of Advanced LIGO and Advanced Virgo’s eleven month long third observing run. The first Gravitational-Wave Transient Catalog (GWTC-1) of compact binary coalescences (CBC) includes candidate events observed by Advanced LIGO and Advanced Virgo during the first (O1) and second (O2) observing runs [8]. The increased sensitivity of Advanced LIGO and Advanced Virgo during O3a has enabled us to increase the number of confident gravitational wave detections more than three-fold over GWTC-1. Together, GWTC-1 and the new candidate events presented here comprise GWTC-2. Fig. 1

shows this consistent increase in both the effective binary neutron star volume–time (BNS VT) of the gravitational wave network, and the number of detections across these observing runs. The BNS VT is Euclidean sensitive volume of the detector network [29, 30] multiplied by the live time of the network and should be approximately proportional to the total number of detections. Our analysis of the O3a dataset has resulted in 39 gravitational wave candidate events passing our false alarm rate (FAR) threshold of 2.0 per year. Given our use of multiple search pipelines to identify candidate events, we expect ~ 3 false alarms, i.e. candidate events caused by instrumental noise, to be present in this catalog. It is not possible to determine with certainty which specific candidate events are due to noise; instead we provide statistical measures of false alarm rate and probability of astrophysical origin. Among these candidate events, 26 have been reported previously in real-time processing via GCN Notices and Circulars [31]. Furthermore, four gravitational wave candidate events from O3a have already been published separately due to their interesting properties: GW190425 [32] is the second gravitational wave event consistent with a BNS coalescence; GW190412 [32] is the first BBH observation with definitively asymmetric component masses, which also produced detectable gravitational radiation beyond the leading quadrupolar order; GW190814 [33] is an even more asymmetric system having a $\sim 23 M_{\odot}$ object merging with a $\sim 2.6 M_{\odot}$ object, making the latter either the lightest black hole or heaviest neutron star known to be in a double compact object system; GW190521 [34, 35] is a BBH with total mass $\sim 150 M_{\odot}$ having a primary mass above $65 M_{\odot}$ at 99% credibility.

Here we present 13 candidate events for the first time along with the 26 previously reported candidates. Among the 39 candidates, we find gravitational wave emission consistent with the coalescence of BBHs, BNSs, and neutron star–black hole binaries (NSBHs).

We report on the status of the Advanced LIGO and Advanced Virgo gravitational wave detectors (Sec. II) and the properties and quality of the data taken during the analyzed period (Sec. III). We then describe the analysis methods that led to the identification of the 39 gravitational wave candidates (Sec. IV), as well as the inference of their parameters (Sec. V). Next, we report the significance of the identified candidates, as well as a comparison to the public gravitational wave alerts (Sec. VI). Finally, we discuss the properties (Sec. VII) and the reconstructed waveforms (Sec. VIII) of each event. Further interpretation of the binary population is conducted in companion papers [36, 37]. We will analyze the second half of Advanced LIGO and Advanced Virgo’s third observing run (O3b) in future publications.

We provide a public data release associated with the results contained in this paper at [38]. This includes the data behind the figures, the simulation data used in estimating search sensitivity, and the posterior samples used in estimating the source properties.

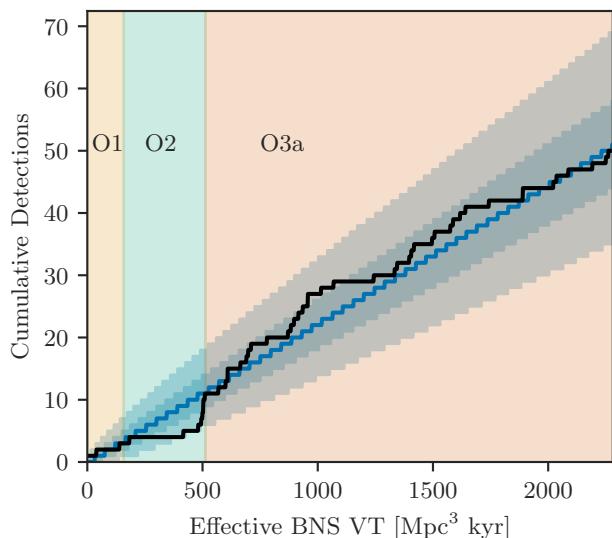


FIG. 1. The number of compact binary coalescence detections versus the effective volume–time (VT) to which the gravitational wave network is sensitive to BNS coalescences. The effective VT is defined as the Euclidean sensitive volume [30] of the second-most sensitive detector in the network at a given time, multiplied by the live time of that network configuration. The Euclidean sensitive volume of the network is the volume of a sphere with a radius given by the BNS inspiral range [29, 30] (shown in Fig. 3) of the second most sensitive detector in the network. To account for the addition of single detector candidates in O3a, a single-detector Euclidean sensitive volume was also included, defined using the inspiral range of the most sensitive detector divided by 1.5. The effective BNS VT does not account for differences in sensitivity across the entire population of signals detected, necessary cosmological corrections, or changes to analysis pipeline efficiency between observing runs, but, as shown in this figure, is consistent with the currently observed rate of detections. The colored bands indicate the three runs, O1, O2 and O3a. The black line is the cumulative number of confident detections of all compact binary coalescences (including black holes and neutron stars) for GWTC-1 [8] and this catalog. The blue line, dark blue band, and light blue band are the median, 50% confidence interval, and 90% confidence interval of draws from a Poisson fit to the number of detections at the end of O3a. The increase in detection rate is dominated by improvements to the sensitivity of the LIGO and Virgo detectors with changes in analysis methods between observing runs being sub-dominant.

II. INSTRUMENTS

The Advanced LIGO [2] and Advanced Virgo [3] detectors are kilometer-scale laser interferometers [39]. The current generation of detectors started operations in 2015, and since then have been alternating periods of observation with periods of tuning and improvement. Since O1 [40] and O2 [8], the sensitivity and robustness of the detectors improved significantly.

The LIGO detectors underwent several upgrades between the end of O2 and the start of O3a [41]. The main laser sources were replaced to allow for higher operating powers. The LIGO Hanford detector operated with 37 W of input power and the Livingston detector with 40 W. Those levels can be compared to 30 W and 25 W during O2 for Hanford and Livingston respectively. The laser sources replacement also reduced fluctuations in the input beam pointing and size that were previously detrimental for the detector sensitivity [42]. At both LIGO detectors the two end test masses were replaced with mirrors with lower scattering losses [43], allowing for higher circulating power. Additionally, annular test masses were installed to reduce noise induced by residual gas damping [44]. In the Hanford interferometer, one of the two input test masses was also replaced, because the one which was previously installed had a large point absorber [45] that limited the amount of power that could be handled in the arm cavities.

The build up of electric charge on the test masses was also an issue during previous runs, therefore several actions were undertaken to mitigate the contribution of this noise source: electric field meters were installed in end stations to monitor the local electric field; baffles were installed in front of the vacuum system ion pumps to mitigate charging, and a test mass discharging system was put in operation and successfully deployed on all LIGO Hanford test masses.

Parametric instabilities [46], i.e., radiation-pressure-induced excitation of the test masses' mechanical modes, also limited the maximum power allowed into the interferometer. This problem was mitigated with the installation of acoustic mode dampers [47] that reduce the mechanical quality factor of the test mass resonant modes and thus suppress parametric instabilities.

The high frequency ($\gtrsim 1$ kHz) sensitivity of both detectors was significantly improved compared to the O2 observing run (a factor 1.68 for the Hanford detector, and 1.96 for the Livingston detector), partially due to the increased circulating power made possible by the improvements already discussed, and by the installation of squeezed light sources [48, 49] to reduce the quantum vacuum noise entering the interferometers [50], making O3 the first observing run of the LIGO detectors that routinely implement quantum noise reduction techniques. GEO600 has been using the same approach since 2011 [51, 52] but has not detected gravitational waves so far due to an overall too-low sensitivity.

Additionally, many beam dumps and baffles were installed at both LIGO sites, to mitigate the effect of scattered light [53] that can be the source of non-stationary disturbances. Finally, the feedback control systems for the seismic isolation and for the angular and longitudinal control of the instruments were improved, increasing the detectors' duty cycle and robustness against external disturbances. With respect to O2, the LIGO Hanford median BNS inspiral range, as defined in [29], increased by a factor 1.64 (from 66 Mpc to 108 Mpc) and the LIGO

Livingston median range by 1.53 (from 88 Mpc to 135 Mpc).

Also in Virgo between the O2 and the O3a observing runs, many upgrades have been implemented to boost the sensitivity.. The most important upgrade was the replacement of the steel wires suspending the four test masses with fused-silica fibers [54] to improve the sensitivity below 100 Hz. This was achieved by changing the design of the final stage of the mirror suspension to improve the screening of the fused-silica fibers [55] from residual particles injected by the vacuum system. In parallel, the vacuum system was modified to avoid dust pollution of the environment.

Another upgrade to improve the low-frequency sensitivity was the suspension of the external injection bench (used to manipulate and steer the input laser beam into the interferometer). In this way, the seismic motion of the optics was reduced, and, consequently, the beam jitter noise contribution [56, 57].

The major upgrade to boost the Virgo high-frequency sensitivity was the installation of a more powerful laser that can deliver more than 65 W output power. After some commissioning activities at different power values, the laser power injected into the interferometer was set to 19 W, improving both the sensitivity and the stability of the interferometer at the same time. The laser power was almost doubled compared to the 10 W injected during O2.¹ In this configuration, due to the marginally stable power recycling cavity, the aberration induced by thermal effects prevented a reliable and robust interferometer longitudinal control, and worsened the alignment performances. Therefore, the thermal compensation system actuators were used to stabilize the power recycling cavity. The end test masses' radii of curvature were tuned with the ring heaters, maximizing the power circulating in the arm cavities [59, 60].

The squeezing technique adopted by LIGO to improve the high frequency sensitivity of the detectors, was also implemented in Virgo interferometer [61]. This system was fully operational also in Virgo for the first time during O3. To reduce the optical losses optimizing the squeezing performance, the photodiodes installed at the interferometer dark port to measure the gravitational wave signals were replaced by high quantum efficiency ones [62].

Moreover, complementary activities have been carried out in parallel to the main upgrades, reducing the overall contribution of the various technical noises. In particular, the improvement of the control strategy for the suspended benches allowed the reduction of the noise contribution below 30 Hz, the installation of baffles and diaphragms on the optical benches and inside the vac-

¹ In [58] it was reported that the injected power during O2 was 14 W; however, measurements taken during end-of-run commissioning activities determined that the correct value was approximately 30% lower than expected.

uum tanks reduced the impact of the scattered light on the sensitivity. Finally, sources of environmental noises have been identified and removed. All these upgrades increased the Virgo median BNS range by 1.73 (from 26 Mpc to 45 Mpc) with respect to the O2 run.

Fig. 2 shows representative sensitivities of the three detectors during O3a, as measured by the amplitude spectral density of the calibrated strain output. Fig. 3 shows the evolution of the detectors' sensitivity over time, as measured by the binary neutron star range. The up-time of the detectors was kept as high as possible, but was nevertheless limited by many factors, such as earthquakes, instrumental failures and planned maintenance periods. The duty cycle for the three detectors was 76% (139.5 days) for Virgo, 71% (130.3 days) for LIGO Hanford, and 76% (138.5 days) for LIGO Livingston. With these duty cycles, the full 3-detector network was in observing mode for 44.5% of the time (81.4 days). Moreover, for 96.9% of the time (177.3 days) at least one detector was observing and for 81.9% (149.9 days) at least two detectors were observing. For comparison, during the O2 run the duty cycles were 62% for LIGO Hanford and 61% for LIGO Livingston, so that two detectors were in observing mode 46.4% of the time and at least one detector was in observing mode 75.6% of the time. The goal was of course to obtain the highest possible duty cycle. The current performance is limited by planned maintenance periods and the time needed to recover the control of the interferometers after large transients triggered, for example, by earthquakes. Work is on-going at all detectors to improve the duty cycle.

III. DATA

Before analyzing LIGO and Virgo time-domain data for gravitational waves, we apply multiple data conditioning steps to accurately calibrate the data into strain and mitigate periods of poor data quality [63]. Segments of data where each interferometer was operating in a nominal state, free from external intervention, are recorded [64]. Data from outside these time periods is not used in analyses unless additional investigations are completed to understand the state of the interferometer [6, 33]. The data conditioning process involves calibration of the data, both in near-real time and in higher latency; subtraction of noise from known instrumental sources; and identification of short-duration noise transients, which we refer to as glitches [65], that should be excluded from any searches for astrophysical candidates either by not considering the data containing the glitches or mitigating the glitches with methods such as gating.

For time periods containing gravitational wave candidate events, additional investigation of the data quality is completed as a part of event validation to evaluate if instrumental artifacts could impact the detection and analysis of the candidate events [66]. These investigations sometimes lead to additional data processing steps such

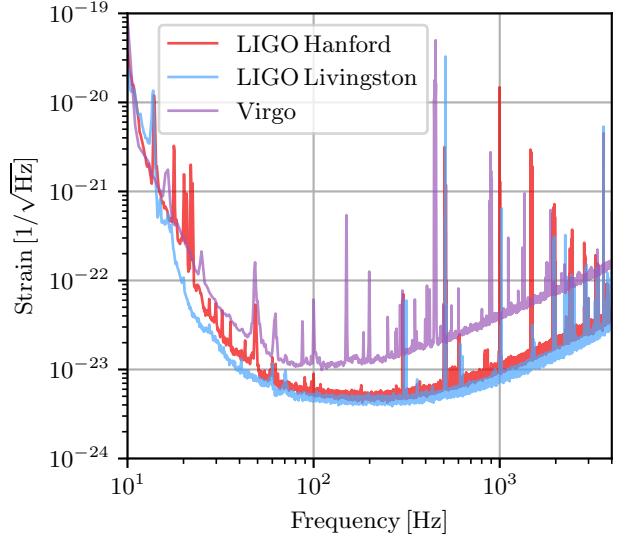


FIG. 2. Representative amplitude spectral density of the three detectors' strain sensitivity (LIGO Livingston 5 September 2019 20:53 UTC, LIGO Hanford 29 April 2019 11:47 UTC, Virgo 10 April 2019 00:34 UTC). From these spectra we compute BNS inspiral ranges of 109 Mpc, 136 Mpc, and 50 Mpc for LIGO Hanford, LIGO Livingston, and Virgo, respectively.

as modeling and subtraction of glitches beyond what is completed to mitigate glitches before searching the data.

This section further outlines the procedures used to calibrate the data collected by LIGO and Virgo, characterize the data quality, validate any identified gravitational-wave candidates, and subtract glitches that may impact the analysis of candidates.

A. Calibration and noise subtraction

The optical power variations at the gravitational wave readout ports of the LIGO and Virgo detectors are calibrated into a time series of dimensionless strain measured by the detectors before use by astrophysical analyses [67, 68]. The calibration process requires data conditioning filters whose response is complex-valued, frequency-dependent, and informed by detailed modeling of the feedback control system along with the interferometric, opto-mechanical response of the detectors [69]. Some control system model parameters vary slowly with time throughout operation of the interferometer. These parameters must be monitored and, when possible, the filters are corrected in near real-time (low-latency) [70]. Other parameters may change at discrete times and cause systematic error in the data stream that cannot be accounted for in low latency. Examples of such error can arise from poorly compensated changes in electronics configurations, accidental application of incorrect control parameter values, model errors not-yet-known at the

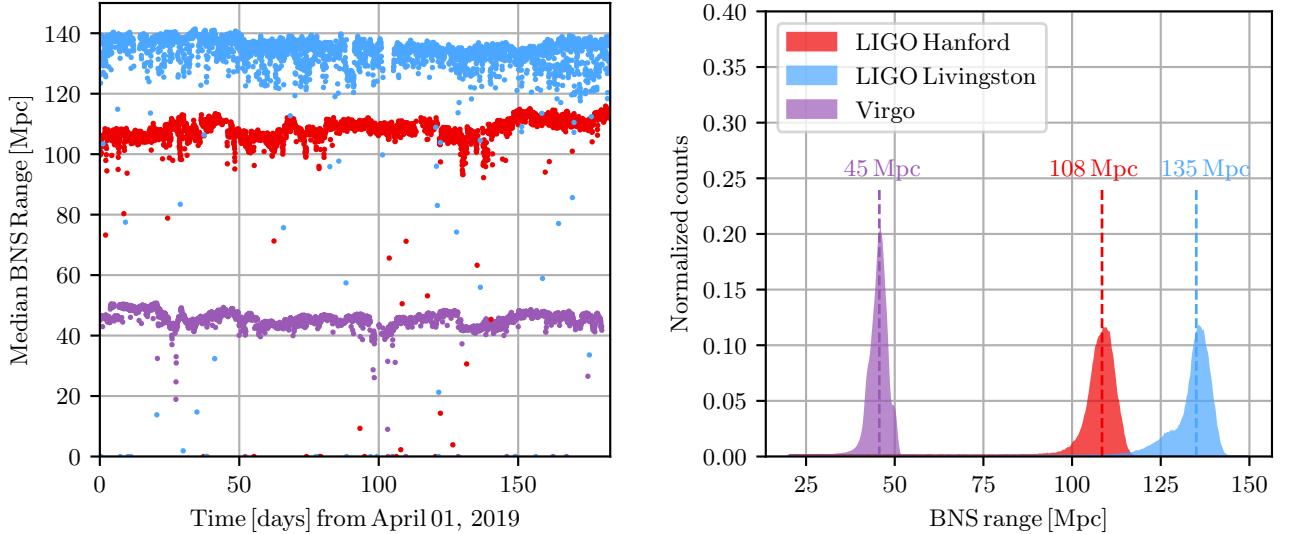


FIG. 3. The BNS range of the LIGO and Virgo detectors. (Left) The evolution in time of the range over the entire duration of O3a. Each data point corresponds to the median value of the range over one-hour-long time segments. (Right) Distribution of the range and the median values for the entire duration of O3a.

start of the observing period, and hardware problems such as failures of analog electronics within the control system. Most of these sources of error are subtle, and can only be assessed once they are measured and quantified a posteriori.

All three detectors use photon calibrator (Pcal) systems [71–73] for absolute reference. These reference systems are used to develop each static detector model, measure parametric time dependence, and establish residual levels of systematic error in each strain data stream once constructed. Each of these measurements required to evaluate the systematic error is done by using the Pcal systems to drive forces on the end test masses via radiation pressure, creating displacement above other detector noise. Validating the strain data stream in low latency for all time, by establishing carefully quantified estimates of the systematic error with these excitations, competes with the desire for unhampered astrophysical sensitivity. As a compromise, systematic error is measured continuously only at a select few frequencies at the edges of the sensitive frequency band of the detector with monochromatic excitations during observation. The data stream is only validated at high frequency resolution, and across the entire detection band, at roughly weekly cadence: the detectors are fully functional, but are declared out of observation mode, and swept-sinusoid and colored-random-noise Pcal excitations are driven above the noise. These measurements can only provide approximate, point-estimate bounds on the data stream's error in low-latency; they cannot reflect the error distribution for all time.

Once an observing period with a stable detector configuration has completed, estimates of the probability dis-

tribution of systematic error for all observation time are created [74]. These estimates leverage the power of hindsight, the collection of measurements mentioned above, and other measurements of individual components gathered while the detector is offline. During this error characterization process, if any identified systematic error is egregious and well-quantified, where possible, the control system model and data conditioning filters are modified to remove the error. The data stream is then regenerated offline from the optical power variations and control signals, and the systematic error estimate is updated accordingly [67].

Results in this paper are derived from either low-latency (C00) or offline, recalibrated (C01) strain data, depending on whether offline data were available and whether the results are sensitive to calibration error. Detection algorithms for gravitational wave candidates, described in Sec. IV, are insensitive to typical levels of systematic error in calibration [75], so low-latency data may be used for additional offline analyses without concern. However, if available, offline data are preferred for its improved accuracy and completeness. At the time the data were searched for candidate events, offline data were only available for a portion of O3a. The candidate events presented in this paper detected prior to 5 June 2019 were identified using LIGO offline data, whereas those from 5 June 2019 until 1 October 2019 were identified using LIGO low-latency data.

Once candidate events are found by detection algorithms using either LIGO data stream, all estimations of the candidates' astrophysical parameters use the C01 LIGO version of strain data using methods described in Sec. V. The C01 LIGO version of strain data was avail-

able for the entirety of O3a at the time these additional analyses were completed. As such analyses are more sensitive to calibration error [76], it is advantageous to use the definitive characterization of error at the time of each event available with LIGO C01 data. The probability distribution of error for LIGO C01 strain data in O3a are characterized in [74]. Analysis of Virgo’s collection of validation measurements during the run did not lead to a significant improvement to the low-latency strain data stream offline. As such, only low-latency strain and its bounds on systematic error from point-estimate measurements are used for all detection and astrophysical parameter estimation results presented in this paper. The bounds of systematic error of Virgo strain in O3a are reported in [77].

Numerous noise sources that limit detector sensitivity are measured and linearly subtracted from the data using witness auxiliary sensors that measure the source of the noise [42, 78, 79]. In O3a, the sinusoidal excitations used for calibration, and noise from the harmonics of the power mains were subtracted from LIGO data as a part of the calibration procedure [79]. This subtraction was completed for both online and offline versions of the calibration. For time periods around a subset of identified candidate events, additional noise contributions due to non-stationary couplings of the power mains were subtracted [80].

The Virgo online strain data production also performed broadband noise subtraction during O3a [77]. The subtracted noises included frequency noise of the input laser, noise introduced controlling the displacement of the beam splitter, and amplitude noise of the 56 MHz modulation frequency. An additional offline strain data set was produced for 14 September 2019 through 1 October 2019 using the same calibration as the online data but with improved noise subtraction resulting in a BNS range increase of up to 3 Mpc [81] and is used in source parameter estimation of candidate events that occurred during this time period.

B. Data quality

During O3a, the data quality was closely monitored using summarized information from the detectors and their subsystems [82, 83]. Deeper studies were conducted to identify the causes of data quality issues, which enabled instrumental mitigation of the sources during the run. For example, at Livingston, glitches from a mechanical camera shutter and beats of varying radio-frequency signals were identified and eliminated. At Hanford and Livingston, strong frequency peaks that wandered in time were tracked down to the amplitude stabilizer for the laser used to provide squeezed light. At Hanford, broad features in the spectrum at 48 Hz and multiples were tracked to scattered light from vacuum chamber doors and mitigated with absorptive black glass. These studies were a part of ongoing efforts to improve the data quality

and the up-time of the detectors [41, 82].

For analyses of gravitational wave transients, the most common data quality issue is the presence of glitches. The rate of glitches with signal-to-noise ratio (SNR) > 6.5 in the LIGO and Virgo detectors in O3a is shown in Fig. 4. In all three detectors, the glitch rate is dominated by glitches with peak frequencies below 100 Hz. This rate was higher than in previous observing runs [66] for both LIGO detectors and was especially problematic at LIGO Livingston, where the rate of glitches was 0.8 per minute in O3a, compared to 0.2 per minute in O2. The Virgo glitch rate decreased significantly between O2 and O3a, thanks to the work done during the O2–O3a shutdown to improve the accuracy of Virgo’s operating point control and to identify, fix, or mitigate several sources of noise. The increased rate of glitches in the LIGO detectors limited the overall sensitivity of searches for gravitational waves in O3a and created challenges for analysis of candidate events.

The most problematic source of glitches in O3a was caused by laser light scattered out of the main laser beam, which is reflected off walls of the vacuum systems and other equipment back into the main beam [53, 86–88]. Scattered light noise is correlated with periods of high seismic activity. For this reason, daily cycles of scattered light glitches were present throughout O3a, especially at LIGO Livingston, tied to ground motion driven by human activity. This noise is often visible as arch-shaped features in time–frequency [86], as shown in Fig. 5, and was present at or near the time of many of the candidate events in this catalog. A significant portion of the increase in glitch rate between O2 and O3a at the LIGO detectors can be accounted for by the increased rate of scattered light glitches [88]. A potential major source of this noise for O3a was light scattered from the gold-coated electrostatic drives mounted to the fused silica reaction masses that are suspended directly behind the LIGO test masses to provide a stable platform for low-noise actuation [88]. Changes were implemented during O3b that reduced scattered light noise entering through this path [88].

Broadband short-duration glitches also occurred often in all detectors during O3a. A sub-class of those, blip glitches [89], was one of the most problematic sources of transient noise in previous observing runs, and is still present in O3a at a rate of 1.4 per hour. These glitches are one of the limiting sources of noise for searches for gravitational waves from high mass compact binaries [90] and no sources or witnesses for the majority of these glitches have been identified. In O3a, there was also an additional population of short duration glitches with SNR > 100 . These loud glitches occurred in both LIGO detectors, with unknown origin. Additional description of these glitches, along with details of potential sources that have been ruled out, can be found in [82].

Many glitches in LIGO and Virgo data have well-understood sources and couplings, making it possible to identify short time periods where excess power from en-

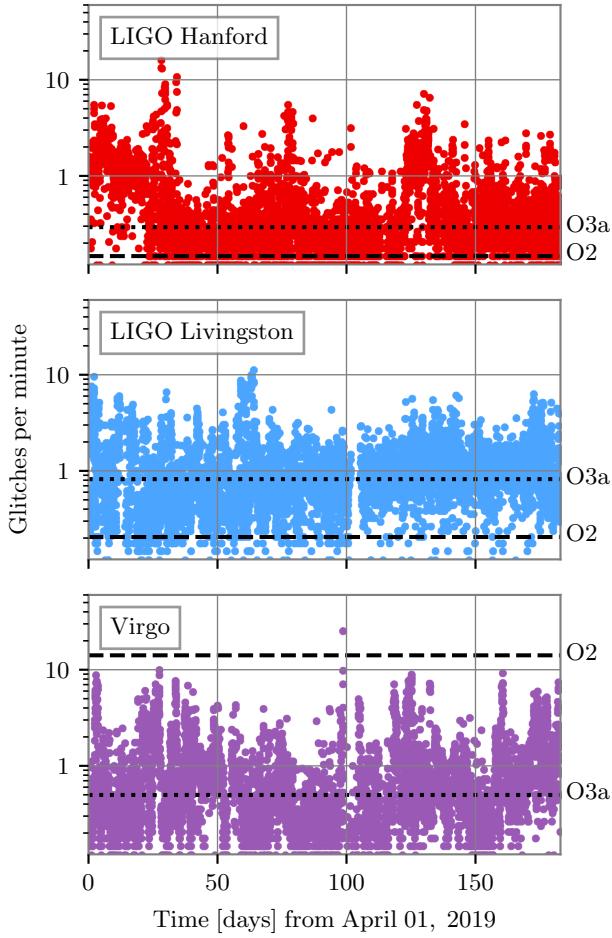


FIG. 4. The rate of single interferometer glitches with SNR > 6.5 and frequency between 10 Hz and 2048 Hz identified by Omicron [84, 85] in each detector during O3a. Each point represents the average rate over a 2048 s interval. Dotted black lines show the median glitch rate for each detector in O2 and O3a.

vironmental or technical sources will be present in the strain data. Flagging these time periods as containing poor data quality, either by removing the data from the search or decreasing the significance of any candidate events identified, has been shown to improve the overall sensitivity of searches for gravitational waves from compact binaries [82, 91, 92]. While a select number of LIGO and Virgo data quality issues are flagged in low latency, such as hardware injections and digital signal overflows, the majority of data quality flags are only available for offline searches.

Before performing searches for gravitational wave signals, periods of poor data quality are flagged at various levels, called categories [63, 66, 82]. In O3a, data from an observatory not operating in a nominal state are flagged (category 1) and not used in any search. Additional periods likely to contain excess power in each LIGO detec-

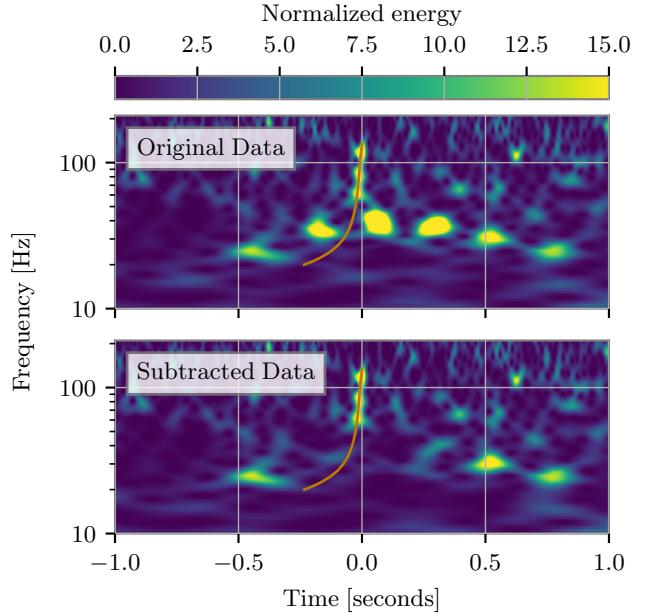


FIG. 5. Top: time–frequency representation of the data surrounding event GW190701_203306 at LIGO Livingston, showing the presence of scattered light glitches (modulated arches). Bottom: The same data after glitch identification and subtraction as described in Sec. III D. In both plots, the time–frequency track of the matched filter template used to identify GW190701_203306 is overlaid in orange. Investigations identified 7 candidate events in coincidence with similar scattering glitches, and required mitigation before further analysis. Despite the clear overlap of the signal with the glitch, the excess power from the glitch is successfully modeled and subtracted.

tor were flagged based on detailed follow up of identified sources of noise (category 2), statistical correlation between witness sensors (category 3), and machine-learning based predictions (iDQ) [92, 93]. No additional data quality products for Virgo were used beyond category 1. The specific set of data quality products used in O3a is search-specific, as described in Sec. IV. Category 2 flags are tuned separately for searches for both gravitational waves from CBC and minimally-modeled (Burst) sources. Category 3 flags are only tuned for Burst searches. The amount of time removed by each category of veto in O3a is shown in Table I.

C. Event Validation

Event validation procedures similar to those used for previous gravitational wave candidate events [8, 66, 82] were used for all candidate events in this catalog to evaluate if instrumental artifacts could impact analysis. Within tens of minutes of low-latency candidate event identification, time–frequency visualizations and

Detector	Category 1	CBC category 2	Burst category 2	Burst category 3
LIGO Hanford	0.27%	0.37%	0.83%	0.19%
LIGO Livingston	0.08%	0.10%	0.64%	0.15%
Virgo	0.15%	—	—	—

TABLE I. Percent of single-detector time removed by each category of veto for each detector. Category 1 vetoes were applied in all analyses described in Sec. IV. CBC category 2 vetoes were applied only by the PyCBC search. Burst categories 2 and 3 were applied only by the cWB search.

monitors of the gravitational wave strain data [94–99] were used to identify any data quality issues present. On the same timescale, data from hundreds of auxiliary sensors monitoring the detectors and their environments were used to identify potential auxiliary witnesses to instrumental artifacts [93, 100, 101]. Tools that relied upon deeper information about glitches and data non-stationarity gathered offline, such as long-term monitors of the instruments and their subsystems [83, 102, 103] and identification of likely sources of glitches by correlation with auxiliary sensors [85, 104, 105], were also used to vet candidate events in this catalog. These procedures did not identify evidence of instrumental origin for any of the candidate events in this catalog, but did identify a number of data quality issues that could potentially impact analyses of these candidate events.

Candidate events with data quality issues identified by these event validation procedures required further mitigation before analysis. In cases when glitches occurred in time coincidence with a candidate event (but could not account for the candidate event itself), additional data processing steps were completed to mitigate the effect of those glitches on estimation of the candidate event parameters. If possible, the identified glitches were subtracted using the methods described in Sec. III D. In cases when sufficient subtraction was not possible, customized configurations of parameter estimation analyses were used to exclude the time period or frequency bandwidth impacted by glitches. An example of a glitch coincident with a signal that required glitch subtraction is shown in Fig. 5. While the presence of excess power from transient noise did not prevent confident identification of this event, glitch subtraction was required before the source properties of the event could be evaluated. Although only data recorded from detectors in observing mode were used to identify candidate events in this catalog, some candidate events occurred at times when one detector in the network was operating, but not in observing mode. If it was concluded that data from the additional detector would substantially impact the scientific conclusions reached from analyzing the candidate, the additional data were investigated. For those cases, the data quality and calibration for the non-observing detector was evaluated to determine whether the data could be used in the estimation of candidate event source properties. Such data were used for one candidate event, GW190814 [33]. The full list of candidate events requiring specific mitigation steps, due to either the presence

of glitches or the state of a detector, is found in Sec. VII. The total number of candidate events requiring mitigation is consistent with the number expected based on the glitch rate in each detector.

D. Glitch subtraction

Data containing gravitational wave candidate events and glitches in the same time-frequency volume are pre-processed through a glitch-subtraction procedure prior to being analyzed by the parameter estimation pipelines. The glitch-subtraction procedure evolved from the BayesWave (BW) algorithm [106–108] used for glitch subtraction in the Livingston detector at the time of the GW170817 binary neutron star merger [12, 109], where the non-Gaussian, incoherent, noise was modeled as a linear combination of wavelets which was subtracted from the data. The number of wavelets used in the fit was determined using a trans-dimensional Markov chain Monte Carlo (MCMC) algorithm that balances using fewer wavelets against the quality of the fit [106].

To prevent the glitch-subtraction procedure from corrupting the signal candidate event, the time segment and bandwidth of the wavelet-based analysis are chosen, when possible, to exclude from subtraction the strongest part of the signal. For cases where the signal and glitch overlapped in time-frequency space, a more robust application of the glitch-subtraction algorithm was used which simultaneously fits for the signal and the glitch. In the signal-plus-glitch application, signal wavelets are included in the model if they are coherent over the detector network (marginalizing over sky location, etc.), while the glitch wavelets are independent in each detector [107]. Only the glitch model wavelets are then used in the subtraction. The signal-plus-glitch procedure was tested by injecting simulated coherent BBH signals onto known single detector glitches from O2 and verifying that the signals were unaffected in the process.

The glitch-subtraction procedure is only used as a pre-processing step for the parameter estimation analysis (described in Sec. V), and is not part of the analyses that determine the presence, or significance, of gravitational wave candidate events. As shown in Fig. 5, the glitch subtraction methods described here are able to successfully remove excess power caused by glitches present near the time of candidate events.

IV. CANDIDATE IDENTIFICATION

Candidate identification happens on two timescales. First, five low-latency gravitational wave pipelines [110–114] process the data immediately after acquisition with the goal of generating public detection alerts to the broader astronomical community within minutes [115]. Second, an offline reanalysis of gravitational wave data is conducted to produce the curated candidate event list here. The offline analysis may benefit from updated data calibration, data quality vetoes, the ability to estimate event significance from the full data, and further algorithmic development that takes place over the course of an observing run. Although the candidate events presented here are derived from offline analysis, we provide a comparison with the public alerts in Sec. VI. Candidates are identified using two methods. The first method searches for minimally-modeled sources. The second method searches for signals from a bank of template waveforms [116] modeled after the expected gravitational wave emission from coalescing compact binaries in general relativity. In Sec. VI, we present results from one search for minimally-modeled transient sources, Coherent WaveBurst (cWB) [111, 117–120], and two searches for modeled sources, GstLAL [110, 121, 122] and PyCBC [29, 123–126]. cWB, GstLAL, and PyCBC were also three of the five low-latency pipelines in O3. The two remaining low latency pipelines, MBTAOnline [113, 127] and SPIIR [114] were not configured for offline reanalysis at the time of this publication and are therefore not included in GWTC-2. Below, we summarize the methods used by each of cWB, GstLAL, and PyCBC to identify candidate events.

A. Coherent WaveBurst search for minimally-modeled transient sources

cWB is a search pipeline for detection and reconstruction of transient GW signals that operates without a specific waveform model [128] and was used in previous searches by the LVC [1, 8, 129]. cWB identifies coincident signal power in multiple detectors, searching for transient signals with durations up to a few seconds in the detector bandwidth. The analysis is performed on the time–frequency data obtained with the Wilson-Daubchies–Meyer wavelet transform [117, 130] and normalized by the amplitude spectral density of the detector noise. cWB selects the time–frequency data samples above fluctuations of the detector noise and groups them into clusters. For clusters correlated in multiple detectors, cWB reconstructs the source sky location and signal waveforms with the constrained maximum likelihood method [111]. The signal SNR is estimated from the signal waveforms reconstructed by cWB, and the network SNR is calculated combining the SNRs of individual detectors.

The cWB detection statistic is based on the coherent

energy E_c obtained by cross-correlating the normalized signal waveforms reconstructed in different detectors. It is normalized by a chi-squared statistic $\chi^2 = E_n/N_{\text{df}}$, where E_n is the residual noise energy estimated after the reconstructed waveforms are subtracted from the data, and N_{df} is the number of independent wavelet amplitudes describing the event. The cWB detection statistic is $\eta_c \propto [E_c/\max(\chi^2, 1)]^{1/2}$, where the χ^2 correction is applied to reduce the contribution of non-Gaussian noise. To improve the robustness of the algorithm against glitches, cWB uses signal-independent vetoes, which reduce the FAR of the pipeline; this includes category 2 Burst data quality flags in the processing step and hierarchical vetoes in the post-production phase [104, 131]. Other vetos applied to candidate events are on the network correlation coefficient $c_c = E_c/(E_c + E_n)$ and the χ^2 . To further reduce the background, the cWB analysis employs additional signal-dependent vetos based on the properties of the time–frequency evolution of compact binary signals: a) the frequency of the signal is increasing in time [132] and b) the central frequency of the signal f_c is inversely proportional to the total mass of the system [133]. cWB searches are performed with two pipeline configurations targeting detection of high-mass ($f_c < 80$ Hz) and low-mass ($f_c > 80$ Hz) BBH systems. They use different signal-dependent vetos defined a priori to alleviate the large variability of non-stationary noise in the detectors’ bandwidth.

We estimate the significance of candidate events by systematically time-shifting the data of one detector with respect to the other in each detector pair, with a time lag so large that actual astrophysical events are excluded, and repeating this for a large number of different time lags over a total time T_{bkg} . We count the number of events N due to instrumental noise that have a ranking statistic value such as the SNR that is at least as large as that of the candidate event and we compute the FAR as the number of background events divided by the total background time [134]. The detection significance of a candidate event identified by either configuration in a single frequency range is determined by its FAR measured by the corresponding cWB configuration. Whenever the low-mass and high-mass configurations overlap, the trials factor of two is included to determine the final FAR [34]. In the end, each configuration reports the selected candidate events and their FAR.

The sensitivity of the cWB search pipeline approaches that of matched-filter methods for coalescing stellar mass BBHs with high chirp masses, where most of the signal energy is concentrated in just a few wavelets of the cWB representation [135]. It is less competitive for low chirp mass events, where the signal power is spread over large time–frequency areas. cWB can also detect sources that are not well represented in current template banks (e.g., eccentric systems or high-mass ratio precessing systems) [136]. Tests with cWB showed that the detection efficiency for a given FAR threshold is slightly smaller with the inclusion of Virgo. Therefore, also to reduce

computing time, all cWB detection candidates and waveform consistency tests reported in this catalog use the Hanford–Livingston network only.

B. GstLAL and PyCBC searches for modeled sources

Both the GstLAL pipeline [110, 121, 122] and the PyCBC [137] pipeline [29, 123–126] implement independently designed matched-filter analyses. Both were used in previous LVC searches for gravitational waves [1, 4–8, 40].

The matched filter method relies on a model of the signal, dependent on the source physical parameters. Most important for the phase evolution of the source (and therefore the matched filter) are the intrinsic parameters: two individual component masses m_1, m_2 , and two dimensionless spin vectors $\vec{\chi}_{\{1,2\}}$, where the dimensionless spin is related to each component’s spin angular momentum \vec{S} by $\vec{\chi}_i = c\vec{S}_i/(Gm_i^2)$.

We also make use of combinations of these intrinsic parameters that are typically well-constrained by gravitational wave measurements; the binary chirp mass [138],

$$\mathcal{M} = \frac{(m_1 m_2)^{3/5}}{(m_1 + m_2)^{1/5}}, \quad (1)$$

determines to lowest order the phase evolution during the inspiral, and is typically better constrained than the component masses. At higher orders, the mass ratio $q = m_2/m_1$ (where $m_2 \leq m_1$) and effective inspiral spin χ_{eff} affect the binary phase evolution. The effective inspiral spin is defined as [139]:

$$\chi_{\text{eff}} = \frac{(m_1 \vec{\chi}_1 + m_2 \vec{\chi}_2) \cdot \hat{L}_N}{M}, \quad (2)$$

where $M = m_1 + m_2$ is the total mass and \hat{L}_N is the unit vector along the Newtonian orbital angular momentum. The spin tilt angle for each component object $\theta_{\text{LS}_i} = \cos^{-1}(\vec{\chi}_i \cdot \hat{L}_N / |\vec{\chi}_i|)$ quantifies the angle between the orbital angular momentum vector and its spin vector. Since the spin and angular momentum vectors vary if the system precesses, by convention we use the spin parameters at a reference frequency of 20 Hz, with the exception of GW190521 where we use 11 Hz for consistency with previous publications [34, 35]. Additional intrinsic parameters are needed to describe eccentricity, which we assume to be zero in our modeled analyses. The timescale for circularization of isolated binaries with non-zero eccentricity at birth is sufficiently short that sources are expected to have negligible eccentricity when they enter the sensitive bands of the LIGO and Virgo detectors [140]. However, dynamically formed binaries may have residual eccentricity as the signal enters the sensitive band of the detector. These systems have been the target of unmodelled searches of previous observing runs, but with no candidate events reported [136].

mm	m_1	m_2	M	q	$\chi_{1,z}$	$\chi_{2,z}$	$f_{\min}(\text{Hz})$
0.99	1, 3	1, 3	< 6	0.33, 1	low	low	15
0.97	3, 150	1, 3	< 153	0.02, 1	high	low	15
0.99	3, 91	3, 50	< 100	0.1, 1	high	high	15
0.97	30, 392	3, 36	< 400	0.02, 0.1	high	high	15
0.99	50, 400	9, 400	> 100	0.1, 1	high	high	10

TABLE II. GstLAL template bank parameters. Low spin denotes the range -0.05 to 0.05 and high spin denotes the range -0.999 to 0.999 .

Seven extrinsic parameters provide the orientation and position of the source in relation to the Earth: the luminosity distance D_L , two-dimensional sky position (right ascension α and declination δ), inclination between total angular momentum and line-of-sight θ_{JN} , time of merger t_c , a reference phase ϕ , and polarization angle ψ .

In general, as the signal travels from the source to the detector its frequency is redshifted by a factor $(1+z)$. For a system involving only black holes, the observed signal is identical to that from a source in the rest frame of the detector with total mass $M^{\text{det}} = (1+z)M$ [141, 142]. For convenience, the templates used by the modeled searches are defined in the rest frame of the detectors which subsumes the factor $(1+z)$ into the definition of masses.

For this work, the GstLAL analysis used a template bank with component masses between $1 M_\odot$ and $400 M_\odot$ with total masses, M^{det} , between $2 M_\odot$ and $758 M_\odot$ and spins that are aligned or anti-aligned with the binary’s orbital angular momentum, such that only the spin components $\chi_{i,z} = \vec{\chi}_i \cdot \hat{L}_N$ are non-zero. The bank was constructed in five regions via a stochastic placement algorithm [143, 144] satisfying different minimal match (mm) [116] criteria with waveforms starting at f_{\min} as described in Table II. Template placement was augmented to improve the collection of background statistics in the last region shown in Table II by a grid of templates distributed uniformly in the logarithm of component mass to improve detection efficiency for systems with primary mass m_1^{det} above $50 M_\odot$ [8, 145]. The TaylorF2 waveform approximant [138, 146–155] was used for templates with $M^{\text{det}} < 1.73 M_\odot$ and the SEOBNRv4_ROM waveform approximant [156] for templates with $M \geq 1.73 M_\odot$.

The PyCBC analysis used a template bank covering the same parameter space as for GWTC-1 [8] shown in Figs. 3 and 7 of [157]. Unlike the previous work, the template bank here was created using a hybrid geometric-random method described in [158, 159]. This new method provides a more efficient template bank—in terms of covering the full parameter space with fewer template waveforms—than the stochastic method [143, 144]. This bank is broadly similar to the parameter space covered in the GstLAL search described above with a key difference being that only templates longer than 0.15 s were kept. Details about this cut and its effect on the

explored mass and spin range can be found in [157].

Both GstLAL and PyCBC scan data from each gravitational wave detector against the above-described banks of template waveforms to produce SNR time-series [29]. The SNR time series are maximized over short time windows to produce a set of triggers for each template and each detector. Triggers that pass an SNR threshold of 4 in one detector form the basis of candidate events according to the procedures for each pipeline described below. PyCBC removes the time period during category 2 veto flags from the final results, while GstLAL uses only iDQ for single-detector triggers and no data quality products for coincident triggers.

GstLAL defines a candidate event as consisting of triggers from one or more gravitational wave detectors ranked by the SNRs of the triggers, signal-consistency tests, time delays between each detector, phase differences between detectors, the (possibly zero) time-averaged volumetric sensitivity of each detector, and the signal population model. These parameters are used as variables in the likelihood-ratio ranking statistic \mathcal{L} [110, 121, 122, 160] which is a monotonic function of the inverse false alarm probability [161].

There are two differences between the ranking statistic used here and in O2 [8]. First, we implemented a template likelihood $p(T|signal, SNR)$ [162], which is the probability that a trigger is recovered by a template T , given the trigger SNR and that the signal belongs to some population. Previous versions of GstLAL approximated $p(T|signal, SNR)$ by a constant in \mathcal{L} [110, 121, 160], implying all templates were equally likely to recover a signal. Now, the template likelihood is informed by the template bank (to account for the fact that templates are not uniformly distributed in parameter space [163]) and a signal-population model, which for this search considers $\vec{\theta} = \{m_1^{\text{det}}, m_2^{\text{det}}, \chi_{1,z}, \chi_{2,z}\}$ and is given by $p(\vec{\theta}|signal) d\vec{\theta} \propto 1/(4m_1^{\text{det}} m_2^{\text{det}}) d\vec{\theta}$. The distribution $p(\vec{\theta}|signal)$ is deliberately broad to minimize the number of missed signals. Second, single-detector candidate events are ranked using both an empirically determined penalty and information from iDQ [93] as described previously. The penalty from iDQ is added to the denominator of \mathcal{L} . Candidates from the GstLAL search had their likelihood ratios and significance estimated using the entire ~ 6 month data set.

PyCBC identifies candidate events by requiring triggers in both LIGO Hanford and LIGO Livingston with a time delay smaller than the light travel time between observatories. These candidate events are then ranked using a set of signal-based vetoes, data quality information, and by comparing the properties of the event against those expected from astrophysical signals [126]. A FAR is then computed for each of these candidate events by estimating the background noise distribution using time-shifted analyses similarly to cWB [29, 125, 164], triggers from LIGO Livingston being timeshifted relative to LIGO Hanford by multiples of 0.1 s. Virgo data were not searched with the PyCBC pipeline due to three-detector

searches not being completely integrated in the version of code used.

A focused search for BBH coalescences [27] is also used here, denoted later as PyCBC BBH. This was motivated by the fact that all signals observed in O1 and O2, with the single exception of the binary neutron star merger GW170817, were consistent with BBH coalescences with mass ratio close to 1 and effective inspiral spins close to 0. The full parameter space search used for GWTC-1 [8], in contrast, was tuned to observe signals anywhere in the possible space of signal parameters, which might include signals that do not have very high matches with search templates. The PyCBC BBH search uses a recently developed detection statistic [27, 165] which includes a number of tuning choices to reject triggers that do not match the filter waveforms well, and also includes a template weighting implementing a prior that signals detectable in any given range of SNR are uniformly distributed in chirp mass. This search enabled PyCBC to identify more BBHs in the O1 and O2 datasets than reported in the GWTC-1 paper [8, 27]. This included some of the BBHs first reported in [23, 25] by independently-developed searches [24, 166]. We use the focused BBH search in this work to better extract BBH coalescences from the data: this search considers only a reduced set of filter templates defined prior to the analysis of O3 data, namely systems with mass ratio $q > 1/3$, and with both component masses (in detector frame) larger than $5 M_\odot$.

C. Estimation of modeled searches sensitivity

In order to estimate the sensitivity of the GstLAL and PyCBC searches, we conducted a campaign of simulated signals injected into the O3a gravitational wave data and analyzed by both matched filter pipelines. The simulated population, intended to cover (or over-cover) the detected population of stellar-mass BBHs [11, 37], contains component masses m_1, m_2 between $2 M_\odot$ and $100 M_\odot$ and extends out to a maximum redshift of 2.3. In order to reduce statistical uncertainties, the mass, spin and redshift distributions should be sufficiently similar to population models for which we intend to estimate merger rates: see [37] (Appendix A) for further discussion of selection functions in population inference. For the simulations, we chose $p(m_1) \propto m_1^{-2.35}$, $p(m_2 | m_1) \propto m_2^2$ (for $m_2 < m_1$), and $\chi_{i,z}$ values distributed uniformly between -0.998 and 0.998 . The cosmological distribution of sources simulates a merger rate in the comoving frame that evolves as $R(z) = R(0)(1+z)^2$, thus the source redshift distribution follows $p(z) \propto (1+z)dV_c/dz$, where V_c is the comoving volume (see, e.g., [167] for further discussion of cosmological effects). The simulation set was generated in two stages: first, points were chosen according to this distribution out to $z = 2.3$; then, these 7.70×10^7 samples were reduced to a set of potentially detectable signals by imposing that the expected LIGO Hanford–LIGO Livingston network SNR, calculated using repre-

sentative noise power spectral densities (PSDs), be above a threshold of 6. The $\sim 157,000$ signals remaining after this cut were assigned merger times ranging uniformly over the duration of O3 for analysis by the searches. The SEOBNRv4_opt aligned-spin waveform model [156] was used for the simulated signals.

The expected number of signals from such a population detected by a given analysis may be written as

$$\hat{N} = \mathcal{V}R(0), \quad (3)$$

where $R(0)$ is the rate of signals per unit volume and unit observing time at present, and \mathcal{V} is the effective surveyed hypervolume, a measure of analysis sensitivity for the injected population.² Since each analysis recovered over 10^4 injections, statistical counting uncertainties in the hypervolumes \mathcal{V} are at the sub-percent level. Our estimates of sensitivity are, though, affected by possible systematic uncertainties in calibration of the strain data. Strain calibration affects the detectability of simulated signals via the magnitude of the response function, which is affected by uncertainties of at most a few percent over the frequency range where the SNR of binary merger signals is accumulated; see [74] for details. The hypervolume \mathcal{V} surveyed by each analysis, at a detection FAR threshold of 2.0 per year, is 0.456 Gpc³ yr for GstLAL, 0.296 Gpc³ yr for PyCBC, and 0.386 Gpc³ yr for PyCBC BBH. For a combination of all matched filter analyses presented in this catalog, with any injection found in *one or more* analysis below the FAR threshold considered as detected, we find a surveyed hypervolume 0.567 Gpc³ yr. Full results from the injection campaign are available via a data release at [168].

D. Estimation of signal probability

For each candidate event, the probability of origin from an astrophysical source p_{astro} and corresponding probability of terrestrial noise origin $p_{\text{terr}} = 1 - p_{\text{astro}}$ may be estimated using the outputs of search pipelines. We obtain these probabilities for the candidate events in this catalog consistent with a BBH, via the Poisson mixture model formalism [169] used in O1 [40, 167, 170]. Only BBH candidate events are considered because, other than GW190425 [171] whose component masses are consistent with those of NSs, all significant detections can be classified as BBHs.³ A low significance candidate NSBH event, GW190426_152155, was reported in low-latency [172]; however, its astrophysical probability is strongly dependent on prior assumptions of the rate of such signals. We therefore do not estimate its p_{astro} here.

² The measure \mathcal{V} is not equivalent to a geometric volume–time (VT), because both the injected population density and the co-moving volume element vary over redshift.

³ There is some ambiguity regarding the BBH nature of GW190814 [33]. Nevertheless, its chirp mass and total mass are not inconsistent with those of BBHs.

We start by collecting the ranking statistics $\vec{x} = \{x_1, x_2, \dots, x_N\}$ of all candidate events more significant than a predefined threshold: for the GstLAL pipeline events are thresholded on FAR, while for PyCBC, a ranking statistic threshold is applied. The threshold for GstLAL is chosen to ensure that the total number of background events considered exceeds the number of signals by a large (~ 100) factor, which enables an accurate estimate of the total rate of background events above threshold. On the other hand, PyCBC estimates the background rate from time-shifted analyses, as outlined above in Section IV B, thus the requirement to include a large number of background events is relaxed. The statistic threshold is then set low enough to include (at least) all events with $p_{\text{astro}} \gtrsim 0.1$.

Additionally, for both GstLAL and PyCBC searches, a threshold of $4.35 M_\odot$ is applied on the chirp mass of the templates, corresponding to a $5 M_\odot + 5 M_\odot$ binary, ensuring that the selected candidate events have template masses consistent with those of putative BBHs. Using the distribution of ranking statistics x under the foreground model, $f(x) = p(x|\text{signal})$, and the distribution under the background model, $b(x) = p(x|\text{noise})$, estimated by each matched filter pipeline, we assign a Bayes factor $k(x) = f(x)/b(x)$ to each event. Assuming that foreground and background triggers are drawn from independent Poisson processes, one can then calculate the posterior over the Poisson expected counts for each process, Λ_1 and Λ_0 .

For the PyCBC searches presented here we proceed as for O1 and O2 [8] and estimate foreground and background event densities empirically for all putative BBH candidate events with ranking statistic above a given threshold. The PyCBC full parameter space and BBH focused searches differ in how their ranking statistics are calculated: for the full search [126], a threshold of 7.9 is applied to the ranking statistic; while for the BBH search [27, 165], a threshold value of 9 is applied. We empirically measure the rate of noise events satisfying these cuts via time-shifted analyses, and infer the posterior over the rate of signals; finally we marginalize over the signal rate to obtain probabilities of astrophysical and terrestrial origin for each event [173]. Since the PyCBC BBH search is more sensitive to realistic BBH signal populations, implying a more accurate estimate of the relative densities of signal and noise events within its targeted mass region, we consider the p_{astro} values from the BBH analysis to be more accurate for events recovered by both searches.

For the GstLAL analysis, we estimate the astrophysical and terrestrial probabilities, $p_{\text{astro}}(x|\vec{x})$, from the joint posterior on the Poisson expected counts, $p(\Lambda_0, \Lambda_1|\vec{x})$, where the set of triggers \vec{x} have a chirp mass $\mathcal{M} > 4.35 M_\odot$, and a FAR $< 8766 \text{ yr}^{-1}$. The prior used to construct the joint counts posterior is taken to be the corresponding posterior from O1 and O2 [174].

V. ESTIMATION OF SOURCE PARAMETERS

Once triggers of interest have been identified, the physical parameters of the candidate event gravitational wave signals are inferred by computing their posterior probability density functions. The uncertainty in the source parameters is quantified by the posterior probability distribution $p(\vec{\vartheta}|\vec{d})$, which is calculated using Bayes' theorem as

$$p(\vec{\vartheta}|\vec{d}) \propto p(\vec{d}|\vec{\vartheta})\pi(\vec{\vartheta}), \quad (4)$$

where $p(\vec{d}|\vec{\vartheta})$ is the likelihood of the data given the model parameters $\vec{\vartheta}$, and $\pi(\vec{\vartheta})$ is the prior probability distribution for the parameters. The likelihood is calculated from a coherent analysis of data from each of the detectors. As in our previous analyses, e.g., [175], we assume that the noise can be treated as Gaussian, stationary, and uncorrelated between detectors [63, 176] in the stretch of data used to calculate the likelihood and to measure the noise PSD. This yields a Gaussian likelihood [142, 177] for the data from a single detector,

$$p(d^i|\vec{\vartheta}) \propto \exp\left[-\frac{1}{2}\left\langle d^i - h_M^i(\vec{\vartheta}) \middle| d^i - h_M^i(\vec{\vartheta})\right\rangle\right], \quad (5)$$

where d^i is the data of the i -th instrument, $h_M^i(\vec{\vartheta})$ is the waveform model calculated at $\vec{\vartheta}$ projected on the i -th detector and adjusted to account for the uncertainty in offline calibration described in Sec. III A. The noise-weighted inner product $\langle a|b \rangle$ [142, 178] requires specifying the frequency range in which the analysis is performed as well as the noise PSD.

Upon detection of a binary merger, exploratory analyses are first conducted to identify which models and settings are most suitable for use in our production analyses. In general, we use a low frequency cutoff of $f_{\text{low}} = 20$ Hz, unless data quality requirements at the time of specific candidate events are different, in which case a specific range is noted in Sec. VII. The high frequency cutoff is always equal to the Nyquist frequency of the analysis for each event, which is determined by the sampling rate. The sampling rate is tailored for specific candidate events, since the signals (especially the higher-mass BBH signals) do not require the full bandwidth available at the native sampling rate of 16 kHz. The PSD characterizing the noise at the time of each event is measured by BW using the same data that is used for likelihood computation [179, 180]. We then obtain the final joint likelihood over all detectors by multiplying together the likelihood from each detector in Eq. (5).

The gravitational wave signal emitted by a circularized compact binary composed of two black holes depends on fifteen unknown parameters, defined in Sec. IV B. The initial masses and spins of the inspiraling black holes determine the peak gravitational wave luminosity and mass and spin of the post-merger remnant black hole, which we calculate from fits to numerical relativity (NR) [5, 181–185]. When one or both objects are neutron stars, matter

effects modify the binary inspiral and are included via the dimensionless quadrupole tidal deformability Λ_i , adding one extra parameter for each neutron star in the binary. Other matter effects, such as octupolar and higher tidal deformabilities, non-black hole spin-induced multipole moments, and f -mode resonances, are parameterized by the Λ_i using quasimassive relations [186]. The dominant tidal contribution to the waveform is given by the dimensionless tidal deformability parameter [187, 188]

$$\tilde{\Lambda} = \frac{16}{13} \frac{[(m_1 + 12m_2)m_1^4\Lambda_1 + (m_2 + 12m_1)m_2^4\Lambda_2]}{(m_1 + m_2)^5}. \quad (6)$$

Non-spinning black holes have $\Lambda_i = 0$ [189, 190], and the waveform models we use adopt the convention that this is true for all black holes [191, 192]. We do not calculate final masses and spins when matter effects are included in the analyses, as this requires an accurate prediction of the ejected mass following possible tidal disruption, taking into account the equation of state and uncertain details of the dynamics of the merger.

A. Waveform models

We characterize the detected binaries using multiple waveform models, each of which uses a different set of modeling techniques and includes different physical effects. For every event with inferred component masses above $3 M_\odot$ in preliminary analyses, we perform production parameter estimation runs using a subset of BBH waveforms. IMRPhenomPv2 [193, 194, 201] is a phenomenological model for gravitational waves from precessing BBH systems, calibrated to NR and using an effective single-spin description to model effects from spin-precession[213]. SEOBNRv4P [156, 198] is based on the effective-one-body (EOB) formalism [214, 215] and calibrated to NR, with a generic two-spin treatment of the precession dynamics. These models rely on twisting up procedures, where aligned-spin, NR-calibrated waveform models defined in the co-precessing frame are mapped (through a suitable frame rotation) to approximate the multipoles of a precessing system in the inertial frame [216–220]. These models do not include contributions to the strain from spherical harmonic modes beyond $\ell = 2$, so we also analyze each event with at least one of the following models that incorporate higher-order multipole (HM) moments and precession effects: IMRPhenomPv3HM [202, 203], SEOBNRv4PHM [198, 199] and NRSur7dq4 [204]. IMRPhenomPv3HM (based on IMRPhenomHM [195]) and SEOBNRv4PHM (based on SEOBNRv4HM [196]) both rely on the twisting-up approach described above. NRSur7dq4 is a surrogate waveform model for BBH systems that directly interpolates a large set of precessing NR simulations. Unlike the other two HM models, NRSur7dq4 waveforms are restricted by the length of the NR simulations in the training set, covering only ~ 20 orbits before merger.

Combined key	Waveform name	Precession	Multipoles ($\ell, m $)	Ref.
ZeroSpinIMR*	IMRPhenomD	×	(2, 2)	[193, 194]
AlignedSpinIMR	SEOBNRv4_ROM	×	(2, 2)	[156]
AlignedSpinIMRHM	IMRPhenomHM	×	(2, 2), (2, 1), (3, 3), (3, 2), (4, 4), (4, 3)	[195]
	SEOBNRv4HM_ROM	×	(2, 2), (2, 1), (3, 3), (4, 4), (5, 5)	[196, 197]
PrecessingSpinIMR	SEOBNRv4P	✓	(2, 2), (2, 1)	[198–200]
	IMRPhenomPv2	✓	(2, 2)	[201, 202]
PrecessingSpinIMRHM	IMRPhenomPv3HM	✓	(2, 2), (2, 1), (3, 3), (3, 2), (4, 4), (4, 3)	[203]
	NRSur7dq4	✓	$\ell \leq 4$	[204]
	SEOBNRv4PHM	✓	(2, 2), (2, 1), (3, 3), (4, 4), (5, 5)	[198–200]
AlignedSpinTidal [†]	IMRPhenomD_NRTidal	×	(2, 2)	[205, 206]
	TEOBResumS	×	(2, 2)	[207]
	SEOBNRv4T_surrogate	×	(2, 2)	[156, 208–210]
PrecessingSpinIMRTidal [†]	IMRPhenomP_NRTidal	✓	(2, 2)	[205, 206]
AlignedSpinInspiralTidal [†]	TaylorF2	×	(2, 2)	[138, 146–155]
AlignedSpinIMRTidal_NSbh	SEOBNRv4_ROM_NRTidalv2_NSbh	×	(2, 2)	[211]
	IMRPhenomNSBH	×	(2, 2)	[212]

TABLE III. Waveform models used in this paper. We indicate which multipoles are included for each model. For precessing models, the multipoles correspond to those in the co-precessing frame. The Combined key column specifies which results generated with these waveforms are combined in our data release under a common key. The models below the horizontal line include matter effects.

* For these datasets we enforce $|\vec{\chi}_i| = 0$.

[†] The data release contains versions of these keys with HS and LS in the name, which correspond to the high spin ($|\vec{\chi}_i| \leq 0.89$) and low spin ($|\vec{\chi}_i| \leq 0.05$) priors respectively.

Any sources with evidence for at least one binary component below $3 M_{\odot}$ are characterized using several waveforms capable of modeling matter effects. For the BNS system GW190425 [32] we use the following: IMRPhenomD_NRTidal and IMRPhenomPv2_NRTidal [205, 206], which are based on the BBH models IMRPhenomD and IMRPhenomPv2 respectively, and incorporate NR and tidal EOB-tuned contributions from tidal interaction as well as equation-of-state dependent self-spin effects; TaylorF2 [138, 146–155], which describes waveforms from the inspiral of non-precessing compact binaries, with matter effects derived in the post-Newtonian formalism, including quadrupole-monopole coupling parameterized in terms of the tidal deformabilities [186, 221, 222]; TEOBResumS [207], an aligned-spin EOB model that incorporates post-Newtonian and self-force contributions to the tidal potential; and finally a frequency-domain surrogate model of aligned-spin SEOBNRv4T waveforms [156, 208–210], which were derived in the EOB approach and include dynamical tides.

For potential NSBH sources with $m_1 > 3 M_{\odot} > m_2$, we use both BBH waveforms and the NSBH-

specific aligned-spin waveform models SEOBNRv4_ROM_NRTidalv2_NSbh [211] and IMRPhenomNSBH [212] which feature the dominant quadrupole modes. SEOBNRv4_ROM_NRTidalv2_NSbh uses SEOBNRv4_ROM as the BBH baseline, while IMRPhenomNSBH employs phase evolution from IMRPhenomD [193, 194] and amplitude from IMRPhenomC [223]. Both models contain a phenomenological description of the tidal effects tuned to NR simulations [224] and include corrections to the amplitude through inspiral, merger, and ringdown to account for a possibility of tidal disruption.

To account for the systematic uncertainties in the waveform models, we combine equal numbers of posterior samples (described in Sec. V B) from all parameter estimation runs for an event that use waveforms with comparable physics. This treats the constituent waveform models in the combined results as having equal weight rather than weighting them by marginal likelihood as suggested in [225]. Table III shows the waveforms employed in this work, the keys under which we group results using these waveforms, and descriptions of the physical effects incor-

porated in the models.

B. Sampling methods

We use several methods to draw samples from the posterior distributions on source parameters using the models described above. The LALInference [177] package was used for most analyses presented in this paper. This package provides two independent stochastic sampling algorithms: a MCMC algorithm and a nested sampling [226] algorithm. We employ LALInference’s nested sampling algorithm for most of the BBH analyses performed with the IMRPhenomD and IMRPhenomPv2 waveforms, and the MCMC algorithm for those performed with SEOBNRv4P. However, the serial nature of these methods makes them unsuitable for use with some of the more computationally costly waveform models, such as waveforms with HMs and precession effects, especially for long-duration signals. For these, we also use RIFT, which performs a hybrid exploration of the parameter space split into intrinsic and extrinsic parameters [227–229], and Parallel Bilby, based on a distributed implementation of nested sampling [230–233], which was also used in previously published analyses of GW190412 [234], GW190425 [32], and GW190814 [33]. The raw posterior samples from the analyses described above are then collated to a common format using the PEsummary package [235].

C. Priors

Each event is analysed independently using a prior distribution on the source parameters that is chosen to ensure adequate sampling of the parameter space and simplicity in using the posterior samples for further analyses. We choose a prior that is uniform in spin magnitudes and redshifted component masses, and isotropic in spin orientations, sky location and binary orientation. The prior on luminosity distance corresponds to a uniform merger rate in the co-moving frame of the source, using a flat Λ CDM cosmology with Hubble constant $H_0 = 67.9 \text{ km s}^{-1} \text{ Mpc}^{-1}$ and matter density $\Omega_m = 0.3065$ [236]; this physically motivated prior differs from that used in previous published results which used a prior $\propto D_L^2$. However, our data release includes parameter estimation samples for both the flat-in-comoving-volume and $\propto D_L^2$ priors. For details on the conversion see Appendix C. Intrinsic source masses are computed by dividing the redshifted masses measured in the detector frame by $(1 + z)$, where z is calculated using the same cosmological model.

For the LALInference and Parallel Bilby analyses, we marginalize over uncertainty in the strain calibration. The calibration errors in amplitude and phase are described by frequency-dependent splines, whose coefficients are allowed to vary alongside signal parameters in

the inference. The prior distribution on the calibration error at each spline node is set by the measured uncertainty at each node [175].

VI. CANDIDATE EVENT LIST

Table IV presents the results from each of cWB, GstLAL, and PyCBC passing a FAR threshold of 2.0 yr^{-1} ; the full gravitational wave name encodes the UTC date with the time of the event given after the underscore. GW190521 [34, 35], GW190425 [32], GW190412 [234], and GW190814 [33] were published previously and these names are used here verbatim. The 2.0 yr^{-1} threshold was chosen to be higher (more permissive) than the threshold used for public alerts, 1.2 yr^{-1} ⁴, but sufficiently low to provide an expected contamination fraction below 10%. An extended candidate event list, which may contain marginally significant triggers, will be provided later once final data calibration and quality checks are available. Unlike GWTC-1 [8], a separate p_{astro} threshold was not applied, however, p_{astro} is greater than 50% for all candidate events for which p_{astro} was calculated in this work, satisfying the same criteria as GWTC-1.⁵ Among the 39 reported candidate events passing the FAR threshold of 2.0 yr^{-1} , 15 were detected by cWB, 36 candidate events were detected by GstLAL, and 27 candidate events were detected by PyCBC; 25 candidate events were recovered by at least two pipelines. Given the FAR threshold and number of candidate events detected, the expectation value for noise events is < 4 in this list. Based on the FAR or the probability of being a signal described in Sec. IV D, GW190426_152155, GW190719_215514, and GW190909_114149 are the most likely to be noise among the candidate event list.

cWB recovered fewer candidate events than either GstLAL or PyCBC. This is expected because cWB has highest sensitivity for short duration, high mass signals, and its sensitivity decreases for lower mass systems with longer duration. cWB also required candidate events to be found in coincidence between at least two detectors.

The difference in candidate event recovery between GstLAL and PyCBC is primarily due to PyCBC analyzing only times when both LIGO Hanford and LIGO Livingston were operating and requiring signals to be observed in both. PyCBC did not analyze Virgo data due to the fact that the code version used for this catalog had not fully integrated 3-detector analysis including Virgo. GstLAL analyzed LIGO and Virgo data and allowed for the detection of candidate events from one,

⁴ https://emfollow.docs.ligo.org/userguide/analysis_index.html#alert-threshold

⁵ Had we only applied a 2.0 yr^{-1} FAR threshold in GWTC-1 and not a p_{astro} threshold, one additional marginal candidate event from GWTC-1 would have passed the criteria we use here: 170616.

two, or three gravitational wave detectors. These algorithmic choices account for the GstLAL-only detection of GW190424_180648, GW190425, GW190620_030421, GW190708_232457 and GW190910_112807, which were detected above the required SNR threshold only in the LIGO Livingston detector, and for GW190630_185205, GW190701_203306, and GW190814, where the inclusion of Virgo was essential for determining event significance. The difference in candidate event recovery between PyCBC and GstLAL is also consistent with the results of the simulation presented in Sec. IV C. After accounting for differences in analyzed data, the GstLAL and PyCBC methods detect a comparable number of candidate events.

The remaining differences between the candidate event lists from GstLAL (GW190426_152155, GW190527_092055, GW190909_114149, and GW190929_012149) and PyCBC (GW190413_052954, GW190514_065416, and GW190719_215514) arise from the low SNR of each event ($\text{SNR} \lesssim 10$). Small fluctuations in SNR caused by different PSD estimation and data segmentation between pipelines leads to differences in significance estimation. This list of low SNR candidate events, which were only identified by one pipeline, also contains the three candidate events with the highest minimum FAR among the pipelines (GW190426_152155, GW190719_215514, and GW190909_114149) which have the highest likelihood among the full candidate event list of being caused by noise.

Since 2 April 2019 20:00 UTC, the LVC produced automated, public preliminary GCN Notices for gravitational wave candidate events appearing in two or more interferometers with FARs less than 6 per year before a multiple analysis trials factor was applied resulting in an effective threshold of 1.2 yr^{-1} [244]. On 11 June 2019, this was extended to include gravitational wave candidate events appearing in only one interferometer and satisfying the same FAR threshold. During O3a, 33 candidate events were disseminated as plausible astrophysical signals; 7 were not recovered above the threshold considered in this work.⁶

S190510g, S190718y, S190901ap, S190910d, S190910h, S190923y, and S190930t [237–243] are the 7 candidate events disseminated via GCNs which are not recovered here. S190718y, S190901ap, S190910h, and S190930t were initially identified as single-detector candidate events (with an SNR above threshold in only one detector) with FARs of 1.14 yr^{-1} , 0.22 yr^{-1} , 1.14 yr^{-1} , and 0.47 yr^{-1} , respectively. Relaxing the demand for coincident observation across interferometers allows LVC analyses to report on additional astrophysically interesting candidate events [171, 245], but also removes a powerful check on the search background and leads to larger uncertainties in the FAR. All public alerts were subsequently

followed-up in low-latency to assess whether the analysis pipelines and detectors were operating as expected. The low-latency followup of S190718y, S190901ap, S190910h, and S190930t did not uncover any reason to retract these candidate events based on data quality. However, after offline re-analysis with additional background statistics, these four single detector candidate events are no longer significant enough to merit inclusion in Table IV.

The remaining three public alert candidate events not recovered here—S190510g, S190910d, and S190923y—were found in coincidence in low-latency, albeit at modest significance. S190510g was found in low-latency by GstLAL and assigned a FAR of 0.28 yr^{-1} . There were initially data quality concerns with S190510g [246] and offline follow-up using an additional 24 hours of background collection revealed the candidate event to be less significant than originally estimated [247]. Comparison to the full O3a background corroborates that the candidate event no longer passes the FAR threshold of 2.0 yr^{-1} . S190910d was identified in low-latency by the SPIIR compact binary search pipeline [114] with a FAR of 0.12 yr^{-1} . The compact binary search pipeline MBTAOnline also recorded a low significance candidate event at this time. However, the candidate event was not observed in low-latency or offline by GstLAL, PyCBC or cWB as significant. Presently, MBTAOnline and SPIIR are configured to run in low-latency only. S190923y was reported in low-latency by PyCBC and assigned a FAR of 1.51 yr^{-1} . GstLAL and MBTAOnline also recorded low significance candidate events at this time. No pipeline retains this candidate event in the offline analysis below the threshold of 2.0 yr^{-1} and it is therefore excluded from Table IV. These and other sub-threshold events will be explored further in a future publication.

The remaining 26 public alerts are recovered in our offline analysis and included in the candidate event list presented in Table IV. The table also includes 13 gravitational wave detections not previously reported. Four of these detections, GW190424_180648, GW190620_030421, GW190708_232457 and GW190910_112807, had detection-level SNR (≥ 4) in only one of the two LIGO detectors, making them single-detector observations from the perspective of candidate event significance. The incorporation of iDQ data quality into event ranking, combined with tuning of the signal consistency tests to further reject the O3a glitch background, improved the sensitivity of the offline GstLAL analysis to single-detector candidate events compared to the low-latency configuration, which accounts for these new discoveries. Nine new detections were observed in two or more interferometers and appear for the first time in Table IV: GW190413_052954, GW190413_134308, GW190514_065416, GW190527_092055, GW190719_215514, GW190731_140936, GW190803_022701, GW190909_114149, and GW190929_012149. Several of these detections were observed in low-latency, but did not meet the criteria for public release. They all exhibit moderate network

⁶ <https://gracedb.ligo.org/superevents/public/03/>

Name	Inst.	cWB		GstLAL				PyCBC		PyCBC BBH		
		FAR (yr ⁻¹)	SNR*	FAR (yr ⁻¹)	SNR	p_{astro}	FAR (yr ⁻¹)	SNR*	p_{astro}	FAR (yr ⁻¹)	SNR*	p_{astro}
GW190408_181802	HLV	$< 9.5 \times 10^{-4}$	14.8	$< 1.0 \times 10^{-5}$	14.7	1.00	$< 2.5 \times 10^{-5}$	13.5	1.00	$< 7.9 \times 10^{-5}$	13.6	1.00
GW190412	HLV	$< 9.5 \times 10^{-4}$	19.7	$< 1.0 \times 10^{-5}$	18.9	1.00	$< 3.1 \times 10^{-5}$	17.9	1.00	$< 7.9 \times 10^{-5}$	17.8	1.00
GW190413_052954	HLV	–	–	–	–	–	–	–	–	7.2×10^{-2}	8.6	0.98
GW190413_134308	HLV	–	–	3.8×10^{-1}	10.0	0.95	–	–	–	4.4×10^{-2}	9.0	0.98
GW190421_213856	HL	3.0×10^{-1}	9.3	7.7×10^{-4}	10.6	1.00	1.9×10^0	10.2	0.89	6.6×10^{-3}	10.2	1.00
GW190424_180648	L	–	–	$7.8 \times 10^{-1\dagger}$	10.0	0.91	–	–	–	–	–	–
GW190425	LV	–	–	$7.5 \times 10^{-4\dagger}$	13.0	–	–	–	–	–	–	–
GW190426_152155	HLV	–	–	1.4×10^0	10.1	–	–	–	–	–	–	–
GW190503_185404	HLV	1.8×10^{-3}	11.5	$< 1.0 \times 10^{-5}$	12.1	1.00	3.7×10^{-2}	12.2	1.00	$< 7.9 \times 10^{-5}$	12.2	1.00
GW190512_180714	HLV	8.8×10^{-1}	10.7	$< 1.0 \times 10^{-5}$	12.3	1.00	3.8×10^{-5}	12.2	1.00	$< 5.7 \times 10^{-5}$	12.2	1.00
GW190513_205428	HLV	–	–	$< 1.0 \times 10^{-5}$	12.3	1.00	3.7×10^{-4}	11.8	1.00	$< 5.7 \times 10^{-5}$	11.9	1.00
GW190514_065416	HL	–	–	–	–	–	–	–	–	5.3×10^{-1}	8.3	0.96
GW190517_055101	HLV	6.5×10^{-3}	10.7	9.6×10^{-4}	10.6	1.00	1.8×10^{-2}	10.4	1.00	$< 5.7 \times 10^{-5}$	10.2	1.00
GW190519_153544	HLV	3.1×10^{-4}	14.0	$< 1.0 \times 10^{-5}$	12.0	1.00	$< 1.8 \times 10^{-5}$	13.0	1.00	$< 5.7 \times 10^{-5}$	13.0	1.00
GW190521	HLV	2.0×10^{-4}	14.4	1.2×10^{-3}	15.0	1.00	1.1×10^0	12.6	0.93	–	–	–
GW190521_074359	HL	$< 1.0 \times 10^{-4}$	24.7	$< 1.0 \times 10^{-5}$	24.4	1.00	$< 1.8 \times 10^{-5}$	24.0	1.00	$< 5.7 \times 10^{-5}$	24.0	1.00
GW190527_092055	HL	–	–	6.2×10^{-2}	8.9	0.99	–	–	–	–	–	–
GW190602_175927	HLV	1.5×10^{-2}	11.1	1.1×10^{-5}	12.1	1.00	–	–	–	1.5×10^{-2}	11.4	1.00
GW190620_030421	LV	–	–	$2.9 \times 10^{-3\dagger}$	10.9	1.00	–	–	–	–	–	–
GW190630_185205	LV	–	–	$< 1.0 \times 10^{-5}$	15.6	1.00	–	–	–	–	–	–
GW190701_203306	HLV	5.5×10^{-1}	10.2	1.1×10^{-2}	11.6	1.00	–	–	–	–	–	–
GW190706_222641	HLV	$< 1.0 \times 10^{-3}$	12.7	$< 1.0 \times 10^{-5}$	12.3	1.00	6.7×10^{-5}	11.7	1.00	$< 4.6 \times 10^{-5}$	12.3	1.00
GW190707_093326	HL	–	–	$< 1.0 \times 10^{-5}$	13.0	1.00	$< 1.0 \times 10^{-5}$	12.8	1.00	$< 4.6 \times 10^{-5}$	12.8	1.00
GW190708_232457	LV	–	–	$2.8 \times 10^{-5\dagger}$	13.1	1.00	–	–	–	–	–	–
GW190719_215514	HL	–	–	–	–	–	–	–	–	1.6×10^0	8.0	0.82
GW190720_000836	HLV	–	–	$< 1.0 \times 10^{-5}$	11.7	1.00	$< 2.0 \times 10^{-5}$	10.6	1.00	$< 3.7 \times 10^{-5}$	10.5	1.00
GW190727_060333	HLV	8.8×10^{-2}	11.4	$< 1.0 \times 10^{-5}$	12.3	1.00	3.5×10^{-3}	11.5	1.00	$< 3.7 \times 10^{-5}$	11.8	1.00
GW190728_064510	HLV	–	–	$< 1.0 \times 10^{-5}$	13.6	1.00	$< 1.6 \times 10^{-5}$	13.4	1.00	$< 3.7 \times 10^{-5}$	13.4	1.00
GW190731_140936	HL	–	–	2.1×10^{-1}	8.5	0.97	–	–	–	2.8×10^{-1}	8.2	0.96
GW190803_022701	HLV	–	–	3.2×10^{-2}	9.0	0.99	–	–	–	2.7×10^{-2}	8.6	0.99
GW190814	LV	–	–	$< 1.0 \times 10^{-5}$	22.2	1.00	–	–	–	–	–	–
GW190828_063405	HLV	$< 9.6 \times 10^{-4}$	16.6	$< 1.0 \times 10^{-5}$	16.0	1.00	$< 1.5 \times 10^{-5}$	15.3	1.00	$< 3.3 \times 10^{-5}$	15.3	1.00
GW190828_065509	HLV	–	–	$< 1.0 \times 10^{-5}$	11.1	1.00	5.8×10^{-5}	10.8	1.00	$< 3.3 \times 10^{-5}$	10.8	1.00
GW190909_114149	HL	–	–	1.1×10^0	8.5	0.89	–	–	–	–	–	–
GW190910_112807	LV	–	–	$1.9 \times 10^{-5\dagger}$	13.4	1.00	–	–	–	–	–	–
GW190915_235702	HLV	$< 1.0 \times 10^{-3}$	12.3	$< 1.0 \times 10^{-5}$	13.1	1.00	8.6×10^{-4}	13.0	1.00	$< 3.3 \times 10^{-5}$	12.7	1.00
GW190924_021846	HLV	–	–	$< 1.0 \times 10^{-5}$	13.2	1.00	$< 6.3 \times 10^{-5}$	12.5	1.00	$< 3.3 \times 10^{-5}$	12.4	1.00
GW190929_012149	HLV	–	–	2.0×10^{-2}	9.9	1.00	–	–	–	–	–	–
GW190930_133541	HL	–	–	5.8×10^{-1}	10.0	0.92	3.4×10^{-2}	9.7	1.00	3.3×10^{-2}	9.8	0.99

TABLE IV. Gravitational wave candidate event list. We find 39 candidate events passing the FAR threshold of 2.0 yr^{-1} in at least one of the four searches. Except for previously published events, the gravitational wave name encodes the UTC date with the time of the event given after the underscore. Bold-faced names indicate the events that were not previously reported. The second column denotes the observing instruments. For each of the four pipelines, cWB, GstLAL, PyCBC, and PyCBC BBH, we provide the FAR and network SNR. Of the 39 candidate events, the 5 that were found above the required SNR threshold in only one of the gravitational wave detectors are denoted by a dagger (\dagger). For candidate events found above threshold in only one detector (single-detector candidate events), the FAR estimate involves extrapolation. All single-detector candidate events in this list by definition are rarer than the background data collected in this analysis. Therefore, a conservative bound on the FAR for triggers denoted by \dagger is $\sim 2 \text{ yr}^{-1}$. GW190521, GW190602_175927, GW190701_203306, and GW190706_222641 were identified by the cWB high-mass search as described in Sec. IV A. GstLAL FARs have been capped at $1 \times 10^{-5} \text{ yr}^{-1}$ to be consistent with the limiting FARs from other pipelines. Dashes indicate that a pipeline did not find the event below the specified 2.0 yr^{-1} threshold. Blank entries indicate that the data were not searched by a pipeline. The probability that an event is astrophysical in origin as described in Sec. IV D is indicated in the column p_{astro} . * PyCBC and cWB SNRs do not include Virgo. S190510g, S190718y, S190901ap, S190910d, S190910h, S190923y, and S190930t [237–243] were candidate events disseminated via GCNs which are not recovered here. The SNR for GW190814 (22.2) differs from the previously published value [33] because the non-observing-mode LIGO Hanford data were not analyzed in this work. The FAR of GW190425 differs from [32] due to different background data and pipeline configuration. The SNR of GW190521 differs from [34] due to the inclusion of sub-threshold Virgo SNR.

SNRs ($\lesssim 10$). The offline analyses here differ from their low-latency counterparts through having improved template banks, improved use of data quality information, improved data calibration, data cleaning, and improved tuning to reject the non-stationary noise background observed in O3a. These differences account for the new moderate SNR candidate events.

During O3a, the LVC issued 8 retractions for public alerts that were promptly determined to be unlikely to have originated from astrophysical systems. The LIGO Livingston detector was more problematic for low-latency analyses than in previous observing runs with the rate of noise glitches being significantly higher than in O2 (see Sec. III B). Low-latency detection, especially for candidate events originating in only one interferometer, was especially challenging during O3a.

S190405ar was the first retraction [248]. This Notice was distributed in error and was never considered to be of astrophysical origin because the event's FAR was significantly above threshold at 6800 yr^{-1} . The remaining retractions were caused by severely non-stationary noise. A glitch in LIGO Hanford data led to the identification and subsequent retraction of S190518bb [249]. S190524q, S190808ae, S190816i, S190822c, S190829u, and S190928c all exhibited extreme non-stationary noise in the LIGO Livingston detector [250–255]. S190822c was assigned a significant FAR at identification but was only observed in a single interferometer. As previously mentioned, single detector triggers are subject to higher uncertainties in FAR. Out of these triggers, an automatic gating method deployed later in the observing run used by searches in order to mitigate non-stationary noise in the detectors would have vetoed S190822c. However, at the time, this automatic gating was not being employed. FARs calculated by the pipelines are correct if the data collected so far is representative of the future data. Online pipelines assign FARs using previously collected data, while offline analyses have access to asynchronous background. If a new non-stationary noise source emerges in the data during an observing run, it is possible for it to be misidentified as a candidate event. Although this can also affect candidates observed in multiple interferometers, single detector candidates are especially susceptible to novel noise sources seen for the first time in low-latency. In some cases where the impact of glitches was unknown, follow-up analyses were performed to remove instrumental artifacts and reassess the candidate event significance. After follow-up, none of these 8 retracted candidate events remained significant. Subsequent offline analyses did not identify them as significant either.

VII. SOURCE PROPERTIES

We analyze the 39 candidate events shown in Table IV with the parameter estimation techniques described in Sec. V. For a subset of candidate events, event validation procedures outlined in Sec. III C identified transient

Name	Mitigation
GW190413_134308	L1 glitch subtraction, glitch-only model
GW190424_180648	L1 glitch subtraction, glitch-only model
GW190425	L1 glitch subtraction, glitch-only model
GW190503_185404	L1 glitch subtraction, glitch-only model
GW190513_205428	L1 glitch subtraction, glitch-only model
GW190514_065416	L1 glitch subtraction, glitch-only model
GW190701_203306	L1 glitch subtraction, glitch+signal model
GW190727_060333	L1 f_{\min} : 50 Hz
GW190814	L1 f_{\min} : 30 Hz; H1 non-observing data used
GW190924_021846	L1 glitch subtraction, glitch-only model

TABLE V. List of candidate-specific data usage and mitigation methods for parameter estimates. Only candidate events for which mitigation of instrumental artifacts was performed are listed. The glitch subtraction methods used for these candidate events are detailed in Sec. III D. The minimum frequency is the lower limit of data used in analyses of gravitational wave source properties for the listed interferometer.

noise that may have impacted the results of parameter inference. In order to minimize the effect of this transient noise, candidate-specific procedures were explored for all impacted candidate events. In most cases, transient noise was mitigated through the glitch subtraction methods outlined in Sec. III D. After application of these methods, the identified transient noise was considered mitigated if the data surrounding the event was consistent with Gaussian noise, as measured by the variance of the measured power spectral density during the time period containing the identified transient [96]. If data were not Gaussian after glitch subtraction, we evaluated the SNR lost by restricting the frequency range of data considered in parameter inference to fully excise the identified transient noise. In cases where the single detector SNR loss was below 10%, this reduced frequency range was used in analyses. Otherwise, the nominal frequency range was used. The full list of candidate events using candidate-specific mitigation, along with the mitigation configuration, is found in Table V.

Based on the investigations described in Appendix A, we find that most gravitational wave candidate events in this catalog exhibit small changes in source parameter estimates when spherical harmonic modes above $\ell = 2$ are included. However, these differences in aggregate could still affect population-level studies, so we present as fiducial results the combined posterior samples of HM runs for all BBHs candidate events except GW190707_093326, GW190720_000836, GW190728_064510, GW190915_235702, GW190924_021846, and GW190930_133541. For these

six exceptions, we present combined IMRPhenomPv2–SEOBNRv4P samples, because the effect of higher modes is either negligible or subdominant to the systematics between IMRPhenomPv2 and SEOBNRv4P results, as detailed in Appendix A. GW190412 [234], GW190521 [34, 35], and GW190814 [33] were analyzed extensively in separate publications with the HM waveform families SEOBNRv4PHM, IMRPhenomPv3HM, or NRSur7dq4, so we present HM runs for these candidate events as fiducial results here and defer readers to those publications for details on those candidate events.⁷

GW190425, GW190426_152155, and GW190814 showed indications of including at least one neutron star, and so were also analyzed using tidal waveforms in addition to IMRPhenomPv2 and SEOBNRv4P, and discussed in Sec. VII B. Further details on waveform systematics and the waveforms employed in this work can be found in Appendix A, and the full suite of posterior samples is publicly available at [256].

In the following subsections, we summarize the results of our parameter estimation analyses and highlight candidate events of particular interest. To identify candidate events with the most extreme parameter values, we repeatedly select one posterior sample at random from each event and record which candidate events have the lowest and highest values of each parameter. From these repeated trials, we determine each event’s probability of having the lowest or highest value for a given parameter. Table VI shows 90% credible intervals on the source parameters of all 39 candidate events using the priors described in Sec. V C and waveforms specified above.

To provide an overview of the posterior distributions of the source parameters for all GWTC-2 candidate events, we show 90% credible regions for all candidate events in the M – q and \mathcal{M} – χ_{eff} planes in Figs. 6 and 7, respectively, and the corresponding one-dimensional marginal posterior distributions on m_1 , q , and χ_{eff} in Fig. 8.

A. Masses of sources with $m_2 > 3 M_\odot$

Our candidate event list includes compact binary mergers that have higher total masses than those in GWTC-1 [8] as well as mergers with component masses in the purported lower mass gap of ~ 2.5 – $5 M_\odot$ [257–260]. Here we describe the masses for candidate events with $m_2 > 3 M_\odot$, which we can confidently expect to be BBHs. The remaining candidate events are described separately in Sec. VII B.

A majority of the masses of black holes reported herein are larger than those reported via electromagnetic observations [261–263]. By repeatedly selecting one posterior sample at random from each event and

recording the most massive among the ensemble, we find that the most massive binary system is probably the one associated with GW190521 [34, 35]. This system has a 98% probability of being the most massive, with a total mass of $163.9^{+39.2}_{-23.5} M_\odot$ and remnant mass $156.3^{+36.8}_{-22.4} M_\odot$, where we have averaged over SEOBNRv4PHM, NRSur7dq4 and IMRPhenomPv3HM waveform families. This averaging is done for consistency with other sources contained in this catalog, in contrast to the individual results reported in [35], where the NRSur7dq4 results are highlighted. The more massive component in the source of GW190521 has an 66% probability of being the most massive BH detected in gravitational waves to date ($m_1 = 95.3^{+28.7}_{-18.9} M_\odot$). GW190519_153544, GW190602_175927, and GW190706_222641 also have notably high total masses with over 50% posterior support for total mass $M > 100 M_\odot$.

The least massive O3a system with $m_2 > 3 M_\odot$ is probably (96%) the one associated with GW190924_021846 ($M = 13.9^{+5.1}_{-1.0} M_\odot$), and likely also has the least massive object over $3 M_\odot$ (85% probability and $m_2 = 5.0^{+1.4}_{-1.9} M_\odot$).

For most sources detected in O3a, the mass ratio posteriors have support at unity and therefore are consistent with equal mass mergers. An exception is the source of GW190412 which was the first event detected that had a confidently unequal mass ratio ($q = 0.28^{+0.12}_{-0.06}$) and exhibited strong signs of HM contributions to the waveform [234]. Although its mass ratio is confidently bounded away from unity, GW190412 only has a 34% chance of having the smallest mass ratio among O3a sources with $m_2 > 3 M_\odot$. As seen in Figs. 6 and 8, the mass ratios are not well constrained for many systems, so one or more could have a smaller mass ratio than GW190412.

B. Sources with $m_2 < 3 M_\odot$

1. GW190425

The least massive O3a system is associated with GW190425 and is likely a binary neutron star system given the inferred masses ($m_1 = 2.0^{+0.6}_{-0.3} M_\odot$ and $m_2 = 1.4^{+0.3}_{-0.3} M_\odot$), but constraints on the tidal parameters do not rule out a NSBH or BBH origin. These estimates were obtained with the PhenomPv2NRT model with a high-spin prior that restricts dimensionless spin magnitudes of the compact objects to be less than 0.89, and previously reported in [32].

Although the inferred component masses of GW190425’s source are consistent with masses of known neutron stars [264–267], the total mass $3.4^{+0.3}_{-0.1} M_\odot$ is greater than that of observed Galactic BNSs [268, 269]. This raises the question of whether GW190425’s source was formed in a different environment from the double neutron star systems observed to date [32, 270–273].

⁷ Where posterior samples from existing publications are used, we still impose the uniform-in-comoving volume prior described in Sec. V C for consistency with the new results in this publication.

Event	M (M_{\odot})	\mathcal{M} (M_{\odot})	m_1 (M_{\odot})	m_2 (M_{\odot})	χ_{eff}	D_{L} (Gpc)	z	M_{f} (M_{\odot})	χ_{f}	$\Delta\Omega$ (deg 2)	SNR
GW190408_181802	$43.0^{+4.2}_{-3.0}$	$18.3^{+1.9}_{-1.2}$	$24.6^{+5.1}_{-3.4}$	$18.4^{+3.3}_{-3.6}$	$-0.03^{+0.14}_{-0.19}$	$1.55^{+0.40}_{-0.60}$	$0.29^{+0.06}_{-0.10}$	$41.1^{+3.9}_{-2.8}$	$0.67^{+0.06}_{-0.07}$	150	$15.3^{+0.2}_{-0.3}$
GW190412	$38.4^{+3.8}_{-3.7}$	$13.3^{+0.4}_{-0.3}$	$30.1^{+4.7}_{-5.1}$	$8.3^{+1.6}_{-0.9}$	$0.25^{+0.08}_{-0.11}$	$0.74^{+0.14}_{-0.17}$	$0.15^{+0.03}_{-0.03}$	$37.3^{+3.9}_{-3.8}$	$0.67^{+0.05}_{-0.06}$	21	$18.9^{+0.2}_{-0.3}$
GW190413_052954	$58.6^{+13.3}_{-9.7}$	$24.6^{+5.5}_{-4.1}$	$34.7^{+12.6}_{-8.1}$	$23.7^{+7.3}_{-6.7}$	$-0.01^{+0.29}_{-0.34}$	$3.55^{+2.27}_{-1.66}$	$0.59^{+0.29}_{-0.24}$	$56.0^{+12.5}_{-9.2}$	$0.68^{+0.12}_{-0.13}$	1500	$8.9^{+0.4}_{-0.7}$
GW190413_134308	$78.8^{+17.4}_{-11.9}$	$33.0^{+8.2}_{-5.4}$	$47.5^{+13.5}_{-10.7}$	$31.8^{+11.7}_{-10.8}$	$-0.03^{+0.25}_{-0.29}$	$4.45^{+2.48}_{-2.12}$	$0.71^{+0.31}_{-0.30}$	$75.5^{+16.4}_{-11.4}$	$0.68^{+0.10}_{-0.12}$	730	$10.0^{+0.4}_{-0.5}$
GW190421_213856	$72.9^{+13.4}_{-9.2}$	$31.2^{+5.9}_{-4.2}$	$41.3^{+10.4}_{-6.9}$	$31.9^{+8.0}_{-8.8}$	$-0.06^{+0.22}_{-0.27}$	$2.88^{+1.37}_{-1.38}$	$0.49^{+0.19}_{-0.21}$	$69.7^{+12.5}_{-8.7}$	$0.67^{+0.10}_{-0.11}$	1200	$10.7^{+0.2}_{-0.4}$
GW190424_180648	$72.6^{+13.3}_{-10.7}$	$31.0^{+5.8}_{-4.6}$	$40.5^{+11.1}_{-7.3}$	$31.8^{+7.6}_{-7.7}$	$0.13^{+0.22}_{-0.22}$	$2.20^{+1.58}_{-1.16}$	$0.39^{+0.23}_{-0.19}$	$68.9^{+12.4}_{-10.1}$	$0.74^{+0.09}_{-0.09}$	28000	$10.4^{+0.2}_{-0.4}$
GW190425	$3.4^{+0.3}_{-0.1}$	$1.44^{+0.02}_{-0.02}$	$2.0^{+0.6}_{-0.3}$	$1.4^{+0.3}_{-0.3}$	$0.06^{+0.11}_{-0.05}$	$0.16^{+0.07}_{-0.07}$	$0.03^{+0.01}_{-0.02}$	—	—	10000	$12.4^{+0.3}_{-0.4}$
GW190426_152155	$7.2^{+3.5}_{-1.5}$	$2.41^{+0.08}_{-0.08}$	$5.7^{+3.9}_{-2.3}$	$1.5^{+0.8}_{-0.5}$	$-0.03^{+0.32}_{-0.30}$	$0.37^{+0.18}_{-0.16}$	$0.08^{+0.04}_{-0.03}$	—	—	1300	$8.7^{+0.5}_{-0.6}$
GW190503_185404	$71.7^{+9.4}_{-8.3}$	$30.2^{+4.2}_{-4.2}$	$43.3^{+9.2}_{-8.1}$	$28.4^{+7.7}_{-8.0}$	$-0.03^{+0.20}_{-0.26}$	$1.45^{+0.69}_{-0.63}$	$0.27^{+0.11}_{-0.11}$	$68.6^{+8.8}_{-7.7}$	$0.66^{+0.09}_{-0.12}$	94	$12.4^{+0.2}_{-0.3}$
GW190512_180714	$35.9^{+3.8}_{-3.5}$	$14.6^{+1.3}_{-1.0}$	$23.3^{+5.3}_{-5.8}$	$12.6^{+3.6}_{-2.5}$	$0.03^{+0.12}_{-0.13}$	$1.43^{+0.55}_{-0.55}$	$0.27^{+0.09}_{-0.10}$	$34.5^{+3.8}_{-3.5}$	$0.65^{+0.07}_{-0.07}$	220	$12.2^{+0.2}_{-0.4}$
GW190513_205428	$53.9^{+8.6}_{-5.9}$	$21.6^{+3.8}_{-1.9}$	$35.7^{+9.5}_{-9.2}$	$18.0^{+7.7}_{-4.1}$	$0.11^{+0.28}_{-0.17}$	$2.06^{+0.88}_{-0.80}$	$0.37^{+0.13}_{-0.13}$	$51.6^{+8.2}_{-5.8}$	$0.68^{+0.14}_{-0.12}$	520	$12.9^{+0.3}_{-0.4}$
GW190514_065416	$67.2^{+18.7}_{-10.8}$	$28.5^{+7.9}_{-4.8}$	$39.0^{+14.7}_{-8.2}$	$28.4^{+9.3}_{-8.8}$	$-0.19^{+0.29}_{-0.32}$	$4.13^{+2.65}_{-2.17}$	$0.67^{+0.33}_{-0.31}$	$64.5^{+17.9}_{-10.4}$	$0.63^{+0.11}_{-0.15}$	3000	$8.2^{+0.3}_{-0.6}$
GW190517_055101	$63.5^{+9.6}_{-9.6}$	$26.6^{+4.0}_{-4.0}$	$37.4^{+11.7}_{-7.6}$	$25.3^{+7.0}_{-7.3}$	$0.52^{+0.19}_{-0.19}$	$1.86^{+1.62}_{-0.84}$	$0.34^{+0.24}_{-0.14}$	$59.3^{+9.1}_{-8.9}$	$0.87^{+0.05}_{-0.07}$	470	$10.7^{+0.4}_{-0.6}$
GW190519_153544	$106.6^{+13.5}_{-14.8}$	$44.5^{+6.4}_{-7.1}$	$66.0^{+10.7}_{-12.0}$	$40.5^{+11.0}_{-11.1}$	$0.31^{+0.20}_{-0.22}$	$2.53^{+1.83}_{-0.92}$	$0.44^{+0.25}_{-0.14}$	$101.0^{+12.4}_{-13.8}$	$0.79^{+0.07}_{-0.13}$	860	$15.6^{+0.2}_{-0.3}$
GW190521	$163.9^{+39.2}_{-23.5}$	$69.2^{+17.0}_{-10.6}$	$95.3^{+28.7}_{-18.9}$	$69.0^{+22.7}_{-23.1}$	$0.03^{+0.32}_{-0.39}$	$3.92^{+2.19}_{-1.95}$	$0.64^{+0.28}_{-0.28}$	$156.3^{+36.8}_{-22.4}$	$0.71^{+0.12}_{-0.16}$	1000	$14.2^{+0.3}_{-0.3}$
GW190521_074359	$74.7^{+7.0}_{-4.8}$	$32.1^{+3.2}_{-2.5}$	$42.2^{+5.9}_{-4.8}$	$32.8^{+5.4}_{-6.4}$	$0.09^{+0.10}_{-0.13}$	$1.24^{+0.40}_{-0.57}$	$0.24^{+0.07}_{-0.10}$	$71.0^{+6.5}_{-4.4}$	$0.72^{+0.05}_{-0.07}$	550	$25.8^{+0.1}_{-0.2}$
GW190527_092055	$59.1^{+21.3}_{-9.8}$	$24.3^{+9.1}_{-4.2}$	$36.5^{+16.4}_{-9.0}$	$22.6^{+10.5}_{-8.1}$	$0.11^{+0.28}_{-0.28}$	$2.49^{+2.48}_{-1.24}$	$0.44^{+0.34}_{-0.20}$	$56.4^{+20.2}_{-9.3}$	$0.71^{+0.12}_{-0.16}$	3700	$8.1^{+0.3}_{-0.9}$
GW190602_175927	$116.3^{+19.0}_{-15.6}$	$49.1^{+9.1}_{-8.5}$	$69.1^{+15.7}_{-13.0}$	$47.8^{+14.3}_{-17.4}$	$0.07^{+0.25}_{-0.24}$	$2.69^{+1.79}_{-1.12}$	$0.47^{+0.25}_{-0.17}$	$110.9^{+17.7}_{-14.9}$	$0.70^{+0.10}_{-0.14}$	690	$12.8^{+0.2}_{-0.3}$
GW190620_030421	$92.1^{+18.5}_{-13.1}$	$38.3^{+8.3}_{-6.5}$	$57.1^{+16.0}_{-12.7}$	$35.5^{+12.2}_{-12.3}$	$0.33^{+0.22}_{-0.25}$	$2.81^{+1.68}_{-1.31}$	$0.49^{+0.23}_{-0.20}$	$87.2^{+16.8}_{-12.1}$	$0.79^{+0.08}_{-0.15}$	7200	$12.1^{+0.3}_{-0.4}$
GW190630_185205	$59.1^{+4.6}_{-4.8}$	$24.9^{+2.1}_{-2.1}$	$35.1^{+6.9}_{-5.6}$	$23.7^{+5.2}_{-5.1}$	$0.10^{+0.12}_{-0.13}$	$0.89^{+0.56}_{-0.37}$	$0.18^{+0.10}_{-0.07}$	$56.4^{+4.4}_{-4.6}$	$0.70^{+0.05}_{-0.07}$	1200	$15.6^{+0.2}_{-0.3}$
GW190701_203306	$94.3^{+12.1}_{-9.5}$	$40.3^{+5.4}_{-4.9}$	$53.9^{+11.8}_{-8.0}$	$40.8^{+8.7}_{-12.0}$	$-0.07^{+0.23}_{-0.29}$	$2.06^{+0.76}_{-0.73}$	$0.37^{+0.11}_{-0.12}$	$90.2^{+11.3}_{-8.9}$	$0.66^{+0.09}_{-0.13}$	46	$11.3^{+0.2}_{-0.3}$
GW190706_222641	$104.1^{+20.2}_{-13.9}$	$42.7^{+10.0}_{-7.0}$	$67.0^{+14.6}_{-16.2}$	$38.2^{+14.6}_{-13.3}$	$0.28^{+0.26}_{-0.29}$	$4.42^{+2.50}_{-1.93}$	$0.71^{+0.32}_{-0.27}$	$99.0^{+18.3}_{-13.5}$	$0.78^{+0.09}_{-0.18}$	650	$12.6^{+0.2}_{-0.4}$
GW190707_093326	$20.1^{+1.9}_{-1.3}$	$8.5^{+0.6}_{-0.5}$	$11.6^{+3.3}_{-1.7}$	$8.4^{+1.4}_{-1.7}$	$-0.05^{+0.10}_{-0.08}$	$0.77^{+0.38}_{-0.37}$	$0.16^{+0.07}_{-0.07}$	$19.2^{+1.9}_{-1.3}$	$0.66^{+0.03}_{-0.04}$	1300	$13.3^{+0.2}_{-0.4}$
GW190708_232457	$30.9^{+2.5}_{-1.8}$	$13.2^{+0.9}_{-0.6}$	$17.6^{+4.7}_{-2.3}$	$13.2^{+2.0}_{-2.7}$	$0.02^{+0.10}_{-0.08}$	$0.88^{+0.33}_{-0.39}$	$0.18^{+0.06}_{-0.07}$	$29.5^{+2.5}_{-1.8}$	$0.69^{+0.04}_{-0.04}$	14000	$13.1^{+0.2}_{-0.3}$
GW190719_215514	$57.8^{+18.3}_{-10.7}$	$23.5^{+6.5}_{-4.0}$	$36.5^{+18.0}_{-10.3}$	$20.8^{+9.0}_{-7.2}$	$0.32^{+0.29}_{-0.31}$	$3.94^{+2.59}_{-2.00}$	$0.64^{+0.33}_{-0.29}$	$54.9^{+17.3}_{-10.2}$	$0.78^{+0.11}_{-0.17}$	2900	$8.3^{+0.3}_{-0.8}$
GW190720_000836	$21.5^{+4.3}_{-2.3}$	$8.9^{+0.5}_{-0.8}$	$13.4^{+6.7}_{-3.0}$	$7.8^{+2.3}_{-2.2}$	$0.18^{+0.14}_{-0.12}$	$0.79^{+0.69}_{-0.32}$	$0.16^{+0.12}_{-0.06}$	$20.4^{+4.5}_{-2.2}$	$0.72^{+0.06}_{-0.05}$	460	$11.0^{+0.3}_{-0.7}$
GW190727_060333	$67.1^{+11.7}_{-8.0}$	$28.6^{+5.3}_{-3.7}$	$38.0^{+9.5}_{-6.2}$	$29.4^{+7.1}_{-8.4}$	$0.11^{+0.26}_{-0.25}$	$3.30^{+1.54}_{-1.50}$	$0.55^{+0.21}_{-0.22}$	$63.8^{+10.9}_{-7.5}$	$0.73^{+0.10}_{-0.10}$	830	$11.9^{+0.3}_{-0.5}$
GW190728_064510	$20.6^{+4.5}_{-1.3}$	$8.6^{+0.5}_{-0.3}$	$12.3^{+7.2}_{-2.2}$	$8.1^{+1.7}_{-2.6}$	$0.12^{+0.20}_{-0.07}$	$0.87^{+0.26}_{-0.37}$	$0.18^{+0.05}_{-0.07}$	$19.6^{+4.7}_{-1.3}$	$0.71^{+0.04}_{-0.04}$	400	$13.0^{+0.2}_{-0.4}$
GW190731_140936	$70.1^{+15.8}_{-11.3}$	$29.5^{+7.1}_{-5.2}$	$41.5^{+12.2}_{-9.0}$	$28.8^{+9.7}_{-9.5}$	$0.06^{+0.24}_{-0.24}$	$3.30^{+2.39}_{-1.72}$	$0.55^{+0.31}_{-0.26}$	$67.0^{+14.6}_{-10.8}$	$0.70^{+0.10}_{-0.13}$	3400	$8.7^{+0.2}_{-0.5}$
GW190803_022701	$64.5^{+12.6}_{-9.0}$	$27.3^{+5.7}_{-4.1}$	$37.3^{+10.6}_{-7.0}$	$27.3^{+7.8}_{-8.2}$	$-0.03^{+0.24}_{-0.27}$	$3.27^{+1.95}_{-1.58}$	$0.55^{+0.26}_{-0.24}$	$61.7^{+11.8}_{-8.5}$	$0.68^{+0.10}_{-0.11}$	1500	$8.6^{+0.3}_{-0.5}$
GW190814	$25.8^{+1.0}_{-0.9}$	$6.09^{+0.06}_{-0.06}$	$23.2^{+1.1}_{-1.0}$	$2.59^{+0.08}_{-0.09}$	$0.00^{+0.06}_{-0.06}$	$0.24^{+0.04}_{-0.05}$	$0.05^{+0.009}_{-0.010}$	$25.6^{+1.1}_{-0.9}$	$0.28^{+0.02}_{-0.02}$	19	$24.9^{+0.1}_{-0.2}$
GW190828_063405	$58.0^{+7.7}_{-4.8}$	$25.0^{+3.4}_{-2.1}$	$32.1^{+5.8}_{-4.0}$	$26.2^{+4.6}_{-4.8}$	$0.19^{+0.15}_{-0.16}$	$2.13^{+0.66}_{-0.93}$	$0.38^{+0.10}_{-0.15}$	$54.9^{+7.2}_{-4.3}$	$0.75^{+0.06}_{-0.07}$	520	$16.2^{+0.2}_{-0.3}$
GW190828_065509	$34.4^{+5.4}_{-4.4}$	$13.3^{+1.2}_{-1.0}$	$24.1^{+7.0}_{-7.2}$	$10.2^{+3.6}_{-2.1}$	$0.08^{+0.16}_{-0.16}$	$1.60^{+0.62}_{-0.60}$	$0.30^{+0.10}_{-0.10}$	$33.1^{+5.5}_{-4.5}$	$0.65^{+0.08}_{-0.08}$	660	$10.0^{+0.3}_{-0.5}$
GW190909_114149	$75.0^{+55.9}_{-17.6}$	$30.9^{+17.2}_{-7.5}$	$45.8^{+52.7}_{-13.3}$	$28.3^{+13.4}_{-12.7}$	$-0.06^{+0.37}_{-0.36}$	$3.77^{+3.27}_{-2.22}$	$0.62^{+0.41}_{-0.33}$	$72.0^{+54.9}_{-16.8}$	$0.66^{+0.15}_{-0.20}$	4700	$8.1^{+0.4}_{-0.6}$
GW190910_112807	$79.6^{+9.3}_{-9.1}$	$34.3^{+4.1}_{-4.1}$	$43.9^{+7.6}_{-6.1}$	$35.6^{+6.3}_{-7.2}$	$0.02^{+0.18}_{-0.18}$	$1.46^{+1.03}_{-0.58}$	$0.28^{+0.16}_{-0.10}$	$75.8^{+8.5}_{-8.6}$	$0.70^{+0.08}_{-0.07}$	11000	$14.1^{+0.2}_{-0.3}$
GW190915_235702	$59.9^{+7.5}_{-6.4}$	$25.3^{+3.2}_{-2.7}$	$35.3^{+9.5}_{-6.4}$	$24.4^{+5.6}_{-6.1}$	$0.02^{+0.20}_{-0.25}$	$1.62^{+0.71}_{-0.61}$	$0.30^{+0.11}_{-0.10}$	$57.2^{+7.1}_{-6.0}$	$0.70^{+0.09}_{-0.11}$	400	$13.6^{+0.2}_{-0.3}$
GW190924_021846	$13.9^{+5.1}_{-1.0}$	$5.8^{+0.2}_{-0.2}$	$8.9^{+7.0}_{-2.0}$	$5.0^{+1.4}_{-1.9}$	$0.03^{+0.30}_{-0.09}$	$0.57^{+0.22}_{-0.22}$	$0.12^{+0.04}_{-0.04}$	$13.3^{+5.2}_{-1.0}$	$0.67^{+0.05}_{-0.05}$	360	$11.5^{+0.3}_{-0.4}$
GW190929_012149	$104.3^{+34.9}_{-25.2}$	$35.8^{+14.9}_{-8.2}$	$80.8^{+33.0}_{-33.2}$	$24.1^{+19.3}_{-10.6}$	$0.01^{+0.34}_{-0.33}$	$2.13^{+3.65}_{-1.05}$	$0.38^{+0.49}_{-0.17}$	$101.5^{+33.6}_{-25.3}$	$0.66^{+0.20}_{-0.31}$	2200	$10.1^{+0.6}_{-0.8}$
GW190930_133541	$20.3^{+8.9}_{-1.5}$	$8.5^{+0.5}_{-0.5}$	$12.3^{+12.4}_{-2.3}$	$7.8^{+1.7}_{-3.3}$	$0.14^{+0.31}_{-0.15}$	$0.76^{+0.36}_{-0.32}$	$0.15^{+0.06}_{-0.06}$	$19.4^{+9.2}_{-1.5}$	$0.72^{+0.07}_{-0.06}$	1700	$9.5^{+0.3}_{-0.5}$

TABLE VI. Median and 90% symmetric credible intervals on selected source parameters. The columns show source total mass M , chirp mass \mathcal{M} and component masses m_i , dimensionless effective inspiral spin χ_{eff} , luminosity distance D_{L} , redshift z , final mass M_{f} , final spin χ_{f} , and sky localization

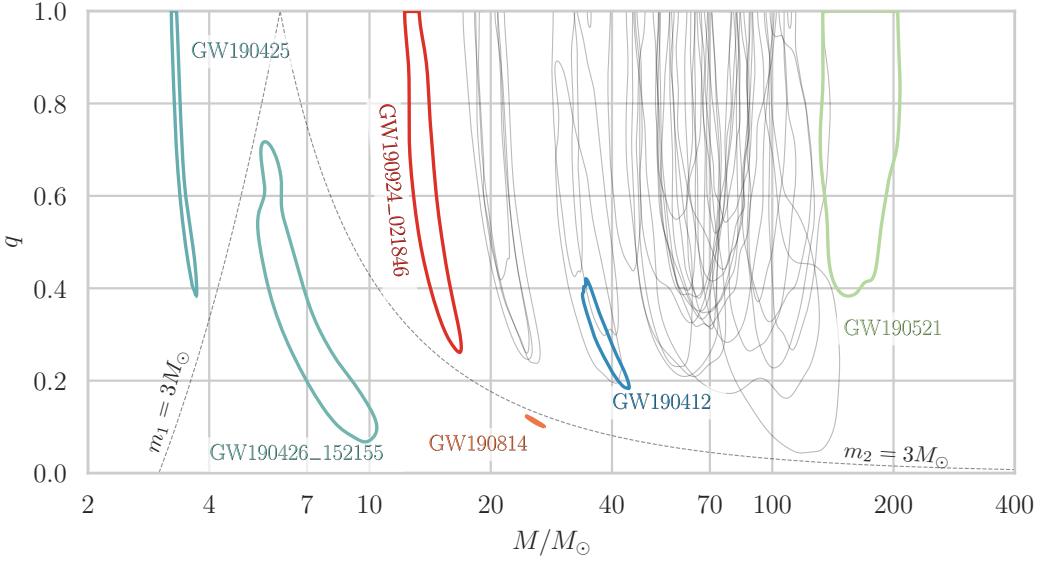


FIG. 6. Credible region contours for all candidate events in the plane of total mass M and mass ratio q . Each contour represents the 90% credible region for a different event. We highlight the previously published candidate events: GW190412, GW190425, GW190521 and GW190814, the potential NSBH GW190426_152155, and finally GW190924_021846, which is most probably the least massive system with both masses $> 3 M_{\odot}$. The dashed lines delineate regions where the primary/secondary can have a mass below $3 M_{\odot}$. For the region above the $m_2 = 3 M_{\odot}$ line, both objects in the binary have masses above $3 M_{\odot}$.

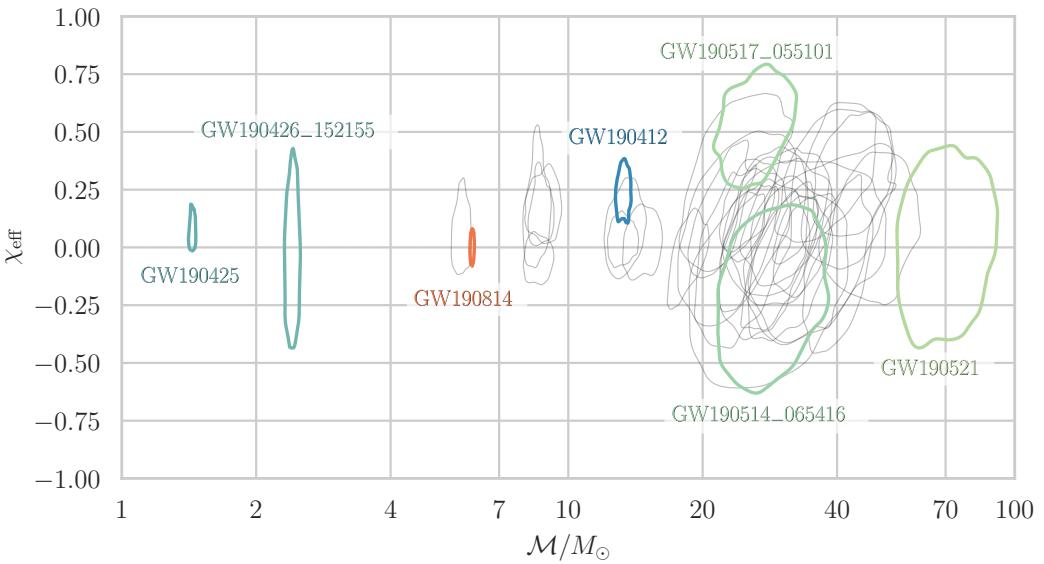


FIG. 7. Credible region contours for all candidate events in the plane of chirp mass \mathcal{M} and effective inspiral spin χ_{eff} . Each contour represents the 90% credible region for a different event. We highlighted the previously published candidate events (cf. Fig. 6), as well as GW190517_055101 and GW190514_065416, which have the highest probabilities of having the largest and smallest χ_{eff} respectively.

Waveform	m_1/M_\odot	m_2/M_\odot	q	$\tilde{\Lambda}$
IMRPhenomD_NRTidal	1.6–1.9	1.5–1.7	0.77–1.0	≤ 560
IMRPhenomPv2_NRTidal	1.6–1.9	1.5–1.7	0.78–1.0	≤ 580
SEOBNRv4T_surrogate	1.6–1.9	1.5–1.7	0.78–1.0	≤ 630
TEOBResumS	1.6–1.9	1.5–1.7	0.77–1.0	≤ 600
<hr/>				
IMRPhenomD_NRTidal	1.6–2.5	1.1–1.7	0.46–1.0	≤ 1090
IMRPhenomPv2_NRTidal	1.6–2.5	1.1–1.7	0.45–1.0	≤ 1080
SEOBNRv4T_surrogate	1.6–2.3	1.2–1.7	0.54–1.0	≤ 1040
TEOBResumS	1.6–2.3	1.2–1.7	0.54–1.0	≤ 870

TABLE VII. Source properties of GW190425 with different waveform families. For the primary mass we give the 0%–90% interval, while for the secondary mass and mass ratio we give the 10%–100% confidence intervals. The quoted 90% upper limits for $\tilde{\Lambda}$ are obtained by reweighing its posterior distribution as detailed in Appendix F of [32]. The top half of the table describes values from low spin prior (LS), while bottom half for high spin prior (HS). For LS, all the results are consistent with each other, while for HS there are slight differences among different waveforms.

Extending the discussion of waveform systematics reported with the discovery of GW190425 [32], we perform four supplementary analyses using the non-precessing EOB models SEOBNRv4T_surrogate and TEOBResumS for low spin and high spin priors. The results are summarised in the Table VII. All the analyses produce quantitatively similar results to the corresponding non-precessing analysis reported in the discovery paper, and the two EOB models produce consistent results between them.

For the low-spin prior, the results agree with the non-precessing IMRPhenomDNRTidal analysis reported in the discovery paper, with SEOBNRv4T_surrogate and TEOBResumS recovering chirp mass as $\mathcal{M} = 1.44^{+0.02}_{-0.02} M_\odot$ and effective inspiral spin of $\chi_{\text{eff}} = 0.01^{+0.01}_{-0.01}$. When allowing larger compact object spins, the results with IMRPhenomDNRTidal and EOB models exhibit some differences, but overall give consistent posteriors.

Our inferences about tidal parameters are likewise consistent with the previous non-precessing analyses. We follow the procedure of [32] and re-weight the posteriors to a flat in $\tilde{\Lambda}$ prior. For the low-spin prior, the two EOB models give very similar bounds, with $\tilde{\Lambda}$ constrained below 630. For the high spin prior, the TEOBResumS waveform model constrains the dimensionless tidal deformability parameter better ($\tilde{\Lambda} \leq 870$) as compared to the other waveform models, as seen in the top panel of Fig. 9.

The two EOB models also constrain the mass ratio better than other waveforms (0.54–1.0) as can be seen in the bottom panel of the Fig. 9. The previously-reported

analyses that allow for significant precessing spins have much greater flexibility and thus, for the high-spin prior, produce a more asymmetric mass ratio posterior distribution than the two non-precessing updates reported here.

Finally, both the EOB models find the luminosity distance of $D_L = 0.16^{+0.07}_{-0.07}$ Gpc independent of the spin prior used.

2. GW190814

Amongst the O3a events, GW190814’s source [33] has the least massive secondary component after the sources of GW190425 and GW190426.152155. GW190814’s less massive component has mass $m_2 = 2.59^{+0.08}_{-0.09} M_\odot$, making its interpretation as as a black hole or a neutron star unclear [33]. GW190814 also has the most extreme mass ratio of all the candidate events, $q = 0.112^{+0.008}_{-0.009}$ [33].

3. GW190426_152155

GW190426_152155 is the candidate event with the highest FAR: 1.4 yr^{-1} . Assuming it is a real signal of astrophysical origin, we estimate its component masses to be $m_1 = 5.7^{+3.9}_{-2.3} M_\odot$ and $m_2 = 1.5^{+0.8}_{-0.5} M_\odot$, raising the possibility that it could have originated from either a BBH or an NSBH source. The mass of the secondary component is consistent with masses of (previously) reported neutron stars [10, 265, 266, 268], but the data are uninformative about potential tidal effects, showing essentially no difference between the prior and posterior on Λ_2 obtained from NSBH waveforms SEOBNRv4_ROM_NRTidalv2_NSBH or IMRPhenomNSBH which we use for our fiducial results. A more definitive assessment of this event likely requires further observations to establish the rate of astrophysical signals with comparable properties.

C. Spins

Most of the compact objects detected in O3a have spin magnitudes consistent with zero, within uncertainties, but in some cases the spins can be constrained away from zero. Two systems have a $> 50\%$ chance of having at least one black hole with dimensionless spin magnitude $\chi_{i=\{1,2\}} > 0.8$: GW190517_055101 has $\chi_{i=\{1,2\}} > 0.8$ with 77% credibility, and GW190521 with 58% credibility. In addition to spin magnitudes, we also consider the effective inspiral spins. As described in Sec. IVB, the effective inspiral spin χ_{eff} is the mass-weighted combination of aligned spins and is approximately conserved under precession. Effective inspiral spin posterior distributions for all candidate events are shown in Figs. 7 and 8. We find 11 systems that show signs of non-zero χ_{eff} . At 90% credibility, GW190412, GW190425, GW190517_055101, GW190519_153544,

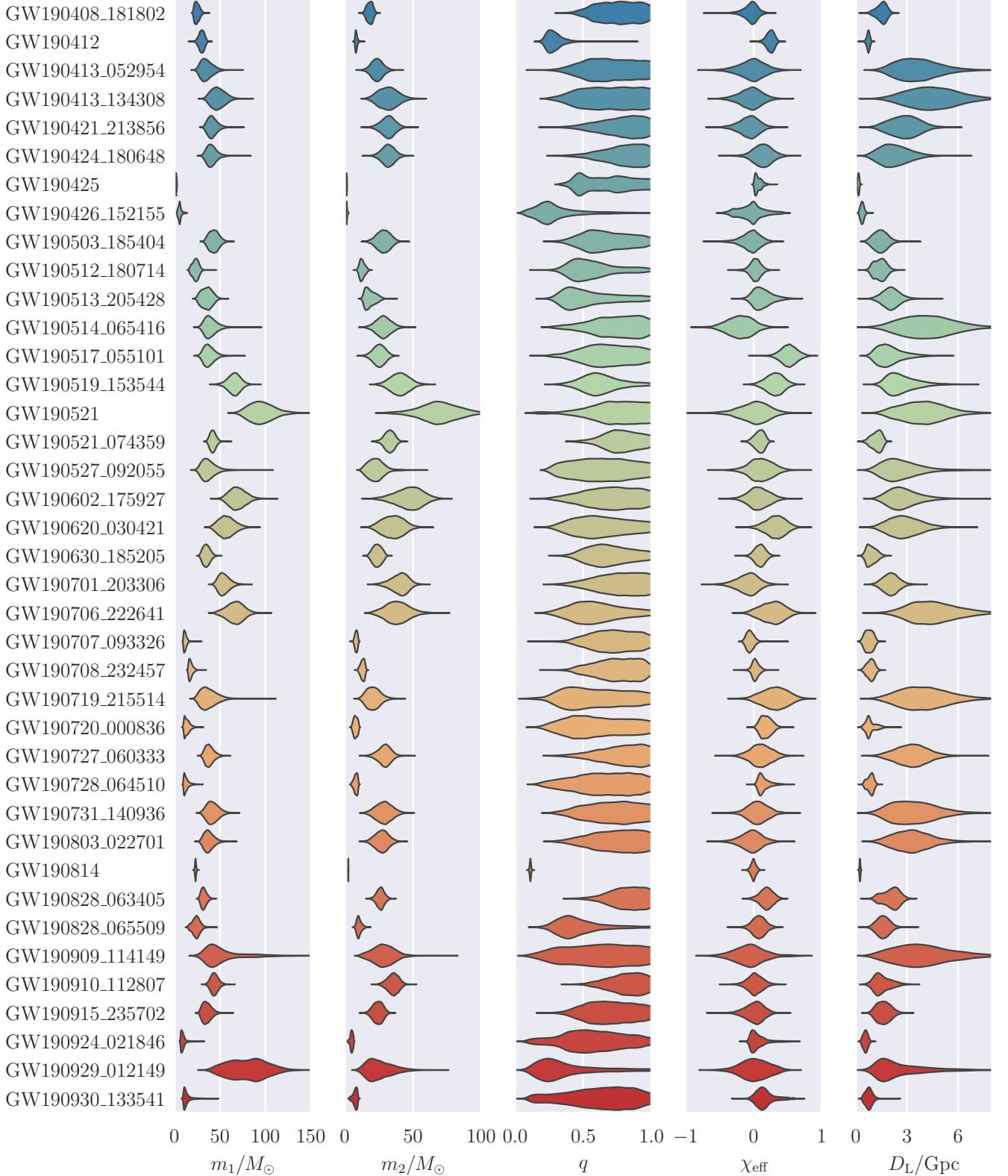


FIG. 8. Marginal posterior distributions on primary mass m_1 , secondary mass m_2 , mass ratio q , effective inspiral spin χ_{eff} , and the luminosity distance d_L for all candidate events in O3a. The vertical extent of each colored region is proportional to one-dimensional marginal posterior distribution at a given parameter value for the corresponding event.

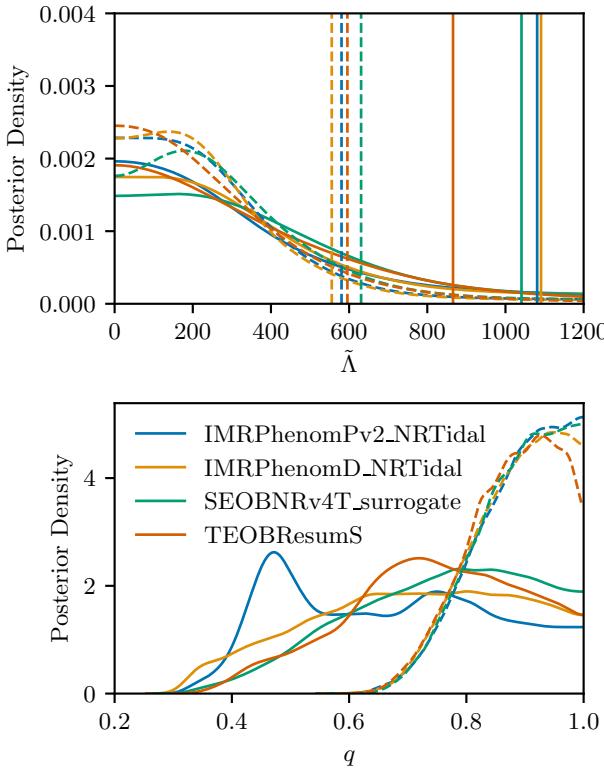


FIG. 9. Marginalised distributions for the combined dimensionless tidal deformability parameter $\tilde{\Lambda}$ (top) and for mass ratio (bottom) for BNS event GW190425. The solid lines correspond to the high spin prior, while the dashed to the low spin prior. In the top panel, the vertical lines mark the corresponding 90% upper bound on $\tilde{\Lambda}$. SEOBNRv4T-surrogate constrains mass ratio better towards equal masses for larger spins. The plot and quoted 90% upper limits for $\tilde{\Lambda}$ are obtained by reweighing posterior distribution as described in Appendix F of [32].

GW190620_030421, GW190706_222641, GW190719_215514, GW190720_000836, GW190728_064510, GW190828_063405, and GW190930_133541 have sources with $\chi_{\text{eff}} > 0$. No individual systems were found to have $\chi_{\text{eff}} < 0$ with $\geq 95\%$ probability, but the event with the lowest χ_{eff} in O3a is probably GW190514_065416 with $\chi_{\text{eff}} = -0.19^{+0.29}_{-0.32}$. The surplus of events with $\chi_{\text{eff}} > 0$ compared to none with $\chi_{\text{eff}} < 0$ suggests that the spin orientations of black holes in binaries are not isotropically distributed with respect to their orbital angular momenta. This possibility is explored further in [37].

The BBH which most likely has the largest measured χ_{eff} is GW190517_055101 ($\chi_{\text{eff}} = 0.52^{+0.19}_{-0.19}$). It has a 60% posterior probability of having the highest χ_{eff} , followed by GW190719_215514 ($\chi_{\text{eff}} = 0.32^{+0.29}_{-0.31}$) with 12%.

In some cases, the joint χ_{eff} and mass-ratio measurement for an event enables a tighter measurement of the spin magnitude of the primary mass than for candidate

events with mass ratios closer to unity. For example, we find primary spin magnitudes of $\chi_1 = 0.40^{+0.40}_{-0.35}$ for the source of GW190720_000836, and $\chi_1 = 0.32^{+0.37}_{-0.28}$ for the source of GW190728_064510. Posterior distributions on spin magnitudes and tilt angles are shown in Fig. 10 for these two candidate events and other select systems that exhibit non-zero spins.

The magnitude of spin-precession in the waveform can be partially captured by the effective precession spin parameter χ_p , which includes the projection of component spin vectors onto the orbital plane [201, 213]. To identify events for which the data constrain χ_p , we compare the χ_p priors—conditioned on the posteriors of χ_{eff} —to the χ_p posteriors, as done in [8]. Conditioning the χ_p prior on the χ_{eff} posterior accounts for the correlated prior between χ_{eff} and χ_p in the default spin prior choices presented in Sec. V. Fig. 11 shows the one-dimensional posterior and (χ_{eff} -conditioned) prior distributions on χ_p for events with Jensen–Shannon (JS) divergence [274] $D_{\text{JS}}^{\chi_p} > 0.05$ bit, where $D_{\text{JS}}^{\chi_p}$ is calculated between the χ_p posterior and conditioned prior. For most of the candidate events, the posterior on χ_p is similar to the prior, indicating that the data are largely uninformative about precession, but there are a few notable exceptions. The χ_p inference on GW190814 is most striking with $D_{\text{JS}}^{\chi_p} = 0.72$ bit: the spin magnitude of the primary mass of the system is constrained to be near zero, resulting in a correspondingly small χ_p value. After GW190814, $D_{\text{JS}}^{\chi_p}$ is largest for GW190412 [234, 275] and GW190521 [34, 35], with $D_{\text{JS}}^{\chi_p} = 0.18$ bit and $D_{\text{JS}}^{\chi_p} = 0.15$ bit, respectively. Unlike GW190814, the χ_p posterior distributions for these events are constrained away from zero, showing preference for precession in these systems. The tilt angle of GW190412’s more massive component’s spin with respect to the Newtonian orbital angular momentum is particularly well constrained to $\theta_{LS_1} = 0.80^{+0.54}_{-0.35}$, as seen in Fig. 10. To further investigate possible precession in these signals, we compute the precession SNR ρ_p [276, 277], which characterizes the observability of precession in gravitational wave data. GW190412 has the largest precession SNR in O3a with a median $\rho_p = 3.0$. Despite parameter estimation preferring high χ_p for GW190521, we calculate $\rho_p = 1.6$ showing that the measurable precession in the signal is small. Using empirical relations between ρ_p and Bayes’ factors for precession [278, 279], we see that the corresponding Bayes’ factors for precession also only mildly favor precession. A population-level analysis of the GWTC-2 spins is presented in [37] and finds evidence for the presence of spin precession in the population.

D. Three-Dimensional Localization

The most distant event, after accounting for measurement uncertainties in distance, is most probably GW190413_134308, with an estimated luminosity distance and redshift of $D_L = 4.45^{+2.48}_{-2.12}$

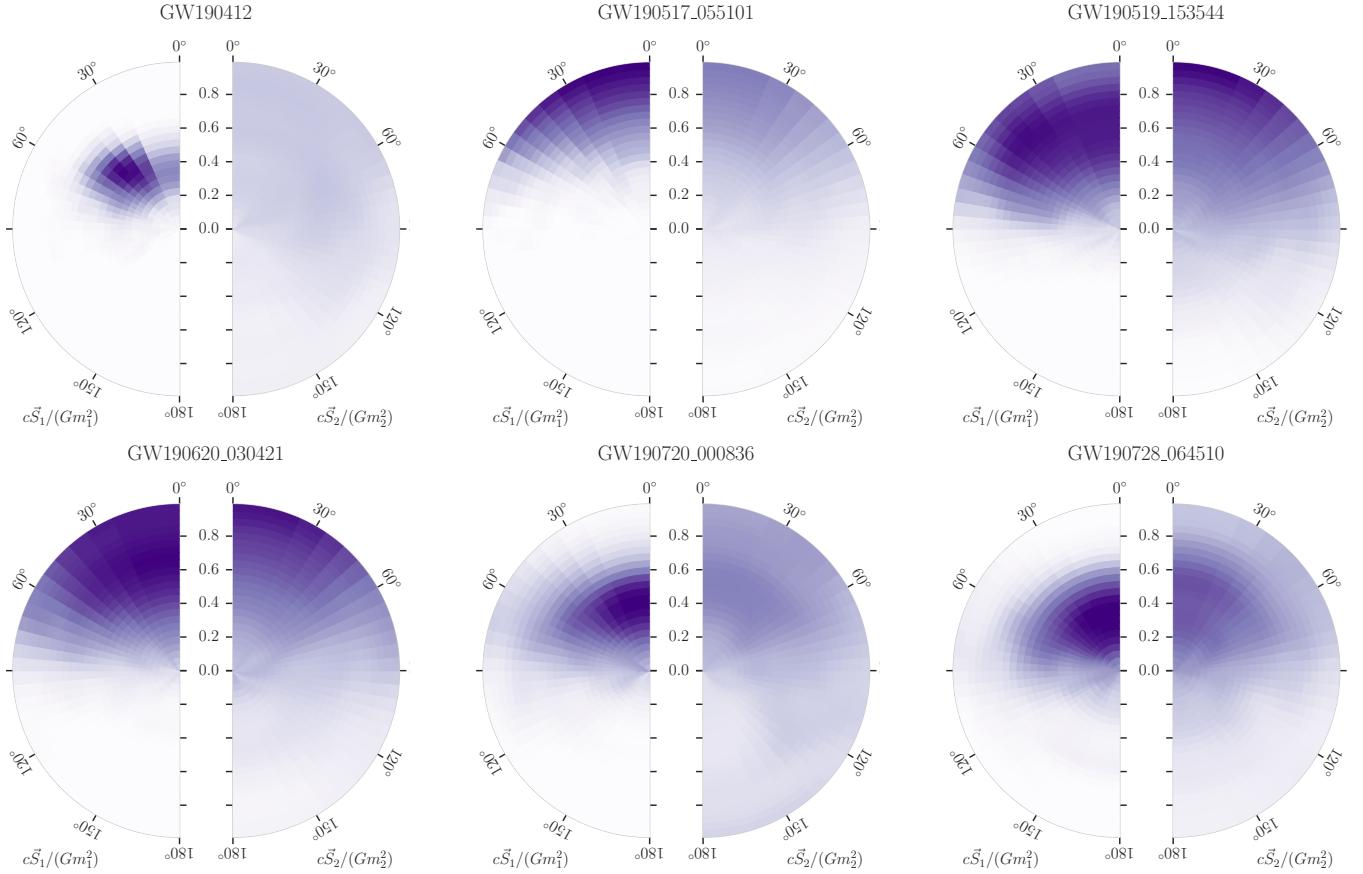


FIG. 10. Estimates of the dimensionless spin parameters $\vec{\chi}_i = c\vec{S}_i/(Gm_i^2)$ for merger components of selected sources. Each pixel's radial distance from the circle's center on the left (right) side of each disk corresponds to the spin magnitude $|\vec{\chi}|$ of the more (less) massive component, and the pixel's angle from the vertical axis indicates the tilt angle θ_{LS} between each spin and the Newtonian orbital angular momentum. Pixels have equal prior probability, and shading denotes the posterior probability of each pixel, after marginalizing over azimuthal angles.

Gpc and $z = 0.71^{+0.31}_{-0.30}$, respectively, approximately twice the luminosity distance of the most distant source from GWTC-1, GW170729 [8], and comparable to the distance for gravitational wave candidate GW170817A [22] (not to be confused with the BNS signal GW170817). However, GW190909_114149, GW190514_065416, GW190521, GW190706_222641, and GW190719_215514 have similarly large distances to GW190413_134308. With candidate events at these cosmological distances, we can more readily measure the Hubble constant, and the evolution of the BBH merger rate over cosmic time. Such analyses are performed in [37]. The closest source detected in O3a is GW190425, with an inferred luminosity distance of $D_L = 0.16^{+0.07}_{-0.07}$ Gpc, about four times the distance for GW170817.

Overall, GW190814 is the best localized event detected in O3a. The contour encompassing 90% of this event's two-dimensional sky position posterior is $\Delta\Omega = 19 \text{ deg}^2$, and 90% of this event's 3D sky position posterior is contained in $\Delta V_{90} = 3.2 \times 10^{-5} \text{ Gpc}^3$. Although GW190814 was initially detected in only LIGO Livingston and Virgo,

it was reanalyzed with LIGO Hanford data, enabling the strong constraint on 3D source position. GW190412 and GW190701_203306 were also relatively well localized with $\Delta\Omega = 21 \text{ deg}^2$, $\Delta V_{90} = 0.035 \text{ Gpc}^3$ and $\Delta\Omega = 46 \text{ deg}^2$, $\Delta V_{90} = 0.035 \text{ Gpc}^3$, respectively, and were both detected in all three detectors. GW190424_180648 was detected and analyzed only in Livingston data, and therefore had the largest localization area and volume with $\Delta\Omega = 28000 \text{ deg}^2$ and $\Delta V_{90} = 28 \text{ Gpc}^3$. Credible intervals on each source's distance and sky area are shown in Table VI. Probability density sky-maps for all events are available as part of the data release [256].

VIII. WAVEFORM RECONSTRUCTIONS

Template-based [177, 280] and minimally-modeled methods [106, 111, 281] are complementary techniques for producing waveform reconstructions. Waveform templates provide a mapping between the shape of the waveforms and the parameters of the source, such as the masses and spins of a binary system, but are limited

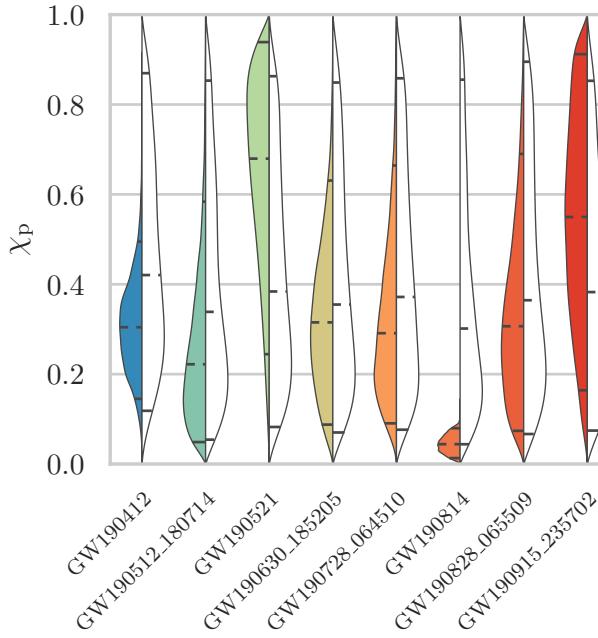


FIG. 11. Posterior and prior distributions on the effective precession spin parameter χ_p for select events. The χ_p prior shown on the right half of each leaf is conditioned on the posterior of χ_{eff} since the default prior in sampling contains correlations between χ_p and χ_{eff} .

to those sources for which we have models. Minimally-modeled reconstructions make it possible to discover unexpected phenomena, but they do not provide a direct mapping to the physical properties of the source. Currently available waveform templates for binary mergers are based on various approximations and numerical solutions to Einstein’s equations that cover a subset of the full parameter space. These waveform templates may thus fail to capture some features of the signal. A more exotic possibility is that gravity behaves differently than predicted by general relativity. One way to test these scenarios is to compare the template-based and minimally-modeled waveform reconstructions.

A standard measure of the agreement between two waveforms h_1, h_2 is the *match*, or *overlap*

$$\mathcal{O}\langle h_1, h_2 \rangle = \frac{\langle h_1 | h_2 \rangle}{\sqrt{\langle h_1 | h_1 \rangle \langle h_2 | h_2 \rangle}}, \quad (7)$$

where $\langle a | b \rangle$ denotes the noise-weighted inner product [142, 178]. The match is constrained to be ≤ 1 .

For each event, the matches were computed between the maximum likelihood template-based waveforms and two minimally-modeled waveform reconstruction methods, cWB [111] and BW [106], using data that contain the event (on-source data). To ascertain whether these match values are in line with expectations, waveforms from the template based analysis were added to data

near, but not including, each event (off-source data). The minimally-modeled waveform reconstructions were repeated multiple times on these off-source data to estimate the distribution of match values we would expect for each event. For each event, these distributions were used to compute a p-value, given by the fraction of off-source match values that are below the on-source match. For some of the lower SNR candidate events the minimally-modeled methods were unable to reconstruct the signals, and these candidate events were excluded from the analysis. Details of the analysis procedure, and additional results, can be found in Appendix B.

Fig. 12 shows the p-values for the analyzed candidate events sorted in increasing order [281, 282]. Events with p-values above the diagonal have on-source matches that are higher than expected, while those below the line have matches that are lower than expected. The cWB analysis shows some events outside the theoretical 90% band for the single-order statistic, which can be due to statistical fluctuations. Because of correlations between p-values in the ordered plot, for 20 p-values the probability of finding exactly four p-values outside the 90% band as in figure 12 is 5.2%, although it may also point to a systematic effect in the analysis. Since the p-values are higher than expected, there is no evidence of a discrepancy with the template-based analysis. Our tests also indicates that if there is indeed a systematic effect, it may originate from an overestimate of the off-source matches no larger than 2%. Further details are given in Appendix B. Overall, the p-value distributions support the null hypothesis that the minimally-modeled waveform reconstructions are consistent with the GR derived waveform templates.

IX. CONCLUSION

We have presented the results from a search for compact binary coalescence signals in the first part of the third observing run of Advanced LIGO and Advanced Virgo. During the period of observations, spanning 1 April to 1 October 2019, the three detectors had sensitivity that significantly exceeded previous observing runs, with median BNS inspiral ranges of 108 Mpc (Hanford), 135 Mpc (Livingston) and 45 Mpc (Virgo). This improved sensitivity allowed us to greatly expand the number of known compact binary mergers, adding 39 new gravitational wave events to the 11 we have previously reported in GWTC-1 [8].

We performed parameter estimation on these 39 new GWTC-2 signals using a range of waveform models, allowing us to incorporate the effect of HMs in the inference of source parameters for BBH systems, and to compare to the systematic differences between waveform families. We find that the sources of these signals include BBHs that are more massive, farther away, and more asymmetric in mass ratio than any sources in GWTC-1, as well as three binaries with at least one component of mass $< 3 M_\odot$. These latter systems may include the first de-

tected NSBH mergers; however, there is insufficient SNR to perform an informative measurement of the tidal deformability that would definitively indicate whether they had an NSBH or BBH origin. We expanded our analysis of the potential BNS signal to encompass further waveforms which include tidal effects, finding agreement with previously-reported results [32].

Our analyses recovered 11 sources with positive effective inspiral spin but zero with negative (at 90% credibility). Although no individual binary in O3a has $\chi_{\text{eff}} < 0$ with high credibility, a hierarchical population analysis [37] of LVC-reported events to date indicates a non-trivial fraction of binaries have negative effective inspiral spin. This would be consistent with the independent observation of gravitational-wave candidate GW170121, which was found to have significant probability of having $\chi_{\text{eff}} < 0$ [23, 27]. We also examined the evidence for misalignment of orbital and component angular momenta, which would be an indication of a dynamical formation channel, and produce precession of the orbital plane. We find only mild evidence in favor of precession in the most significant case of GW190412 [234, 275]. We also performed consistency checks between the waveform models and the observed data, finding no statistically significant differences.

A pair of companion papers make use of the events in GWTC-2 to study source populations and fundamental physics. The inferred population distribution of compact object mergers is described in [37], which reports an updated BBH merger rate density of $23.9^{+14.9}_{-8.6} \text{ Gpc}^{-3} \text{ yr}^{-1}$, and rate density for BNS of $320^{+490}_{-240} \text{ Gpc}^{-3} \text{ yr}^{-1}$. This paper also investigates mass and spin distributions, and finds evidence for a population of BBH systems with spins misaligned from the orbital plane. Eight tests of general relativity are reported in [36], showing no evidence for violations of Einstein’s theory of gravity, leading to some of the best constraints on alternative theories to date.

Data products associated with this catalog are available through the Gravitational Wave Open Science Center (GWOSC) at <https://gw-openscience.org> [256]. Data associated with all events described in this paper are available through the GWOSC Event Portal, including calibrated strain time-series, parameter estimation posterior samples, tables of 90% credible intervals for physical parameters, and search pipeline results. These data products may be accessed through a web browser or open source client package [283].

The online Gravitational Wave Transient Catalog represents a cumulative set of events found in LIGO–Virgo data, including detections presented in GWTC-1, and now also events from the first six months of the O3 observing run. O3 continued from November 2019 until March 2020. Analysis of the second portion (O3b) is currently in progress, and events found during this period will be added in the next update.

The Advanced LIGO and Advanced Virgo detectors are currently undergoing commissioning to further im-

prove their sensitivity, and will be joined in their fourth observing run by the KAGRA detector [284]. This should lead to improvements in the detection rate and source localization, improving the prospects for multimessenger observation of future sources [285, 286].

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The detection of the signals and subsequent significance evaluations in this catalog were performed with the GstLAL-based inspiral software pipeline [110, 121, 122] built on the LALSUITE software library [287], and with the PyCBC [29, 123–126] and cWB [111, 117–120] packages. Parameter estimation was performed with the LALInference [177] and LALSimulation libraries within LALSuite [287], the Bilby and Parallel Bilby libraries [230–232] using the dynesty nested sampling package [233], and the RIFT library [227–229]. PESummary was used to post-process and collate parameter estimation results [235]. Estimates of the noise spectra and glitch models were obtained using BayesWave [106, 107, 180]. The cWB and BayesWave packages were also used to generate waveform reconstructions. Plots were prepared with Matplotlib [288], Seaborn [289] and gwpy [290]. NumPy [291] and SciPy [292] were used in the preparation of the manuscript.

Appendix A: Waveform systematics

The choice of waveform influences our inferences of source properties [8, 293, 294]. As such, we employ multiple waveform families in the inference of each event’s source parameters. The full list of models represented in our publicly available results for each event is shown in Table VIII.

There have been many tools designed to quantify difference between probability distributions, one of which is the Kullback–Leibler (KL) divergence [295]. It is defined by

$$D_{\text{KL}}(p|q) = \int p(\vartheta) \log_2 \left(\frac{p(\vartheta)}{q(\vartheta)} \right) d\vartheta \quad (\text{A1})$$

where $p(\vartheta), q(\vartheta)$ are two probability distributions. However, the KL divergence is not symmetric, $D_{\text{KL}}(p|q) \neq D_{\text{KL}}(q|p)$ and further D_{KL} can diverge if the probability distributions are disjoint, which makes it impractical to use when comparing posterior distributions of parameter estimation runs.

Both of these issues are addressed by the JS divergence [274] which is a smoothed and symmetrized version of D_{KL} . It is defined as

$$D_{\text{JS}}(p, q) \equiv \frac{1}{2} [D_{\text{KL}}(p|s) + D_{\text{KL}}(q|s)] \quad (\text{A2})$$

where $s = (p + q)/2$ is the average distribution. By construction, the JS divergence is symmetric and it satisfies $0 \leq D_{\text{JS}} \leq 1$ bit, which follows from

$$D_{\text{KL}}(p|s) = \int p(\vartheta) \log_2 \left(\frac{2p(\vartheta)}{p(\vartheta) + q(\vartheta)} \right) d\vartheta \leq \int p(\vartheta) \log_2 \left(\frac{2p(\vartheta)}{p(\vartheta)} \right) d\vartheta = 1 \text{ bit.} \quad (\text{A3})$$

The convenient properties of the JS divergence make it a useful measure of the difference between posterior probability distributions, and we adopt it to quantify the systematics in our results resulting from different analysis choices.

We use the JS divergence to investigate two sources of systematics that can impact the results of inference: the differences in the models with equivalent physics due to modeling choices, and differences due to the inclusion of different physical effects. To assess the importance of the former, we compare the results using our two fiducial precessing waveform models (IMRPhenomPv2 and SEOBNRv4P). For the latter, we consider inclusion of HMs beyond the dominant quadrupole by comparing SEOBNRv4P to models that include HMs: SEOBNRv4PHM and NRSur7dq4. We compute the JS divergence between one-dimensional marginal distributions on two key parameters: mass ratio and effective inspiral spin. We use a threshold of 0.007 bit to deem the differences signifi-

cant, which for a Gaussian corresponds to a 20% shift in the mean, measured in units of one standard deviation. This threshold is larger than 0.002 bit, which is the variation that has been shown to arise due to stochastic sampling [232]. In the following subsection, we describe how we use our computed JS divergences and JS threshold to choose the default parameter estimation results shown in this work.

1. Choice of waveform models for each event

We use the above considerations to select which waveform model(s) are used as the fiducial results presented in Sec. VII.⁸ In particular, we present results from models with HMs if the following conditions are satisfied for any of the three key parameters and any of the HM models:

Event	Available Runs
GW190408_181802	IMRPhenomD, IMRPhenomPv2, SEOBNRv4P, SEOBNRv4PHM
GW190412	IMRPhenomD, IMRPhenomHM, IMRPhenomPv2, IMRPhenomPv3HM , SEOBNRv4HM_ROM, SEOBNRv4P, SEOBNRv4PHM , SEOBNRv4_ROM
GW190413_052954	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190413_134308	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P
GW190421_213856	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190424_180648	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190425	IMRPhenomD_NRTidal-HS, IMRPhenomD_NRTidal-LS, IMRPhenomPv2_NRTidal-HS , IMRPhenomPv2_NRTidal-LS, SEOBNRv4T_surrogate_HS, SEOBNRv4T_surrogate_LS, TEOBResumS-HS, TEOBResumS-LS, TaylorF2-HS, TaylorF2-LS
GW190426_152155	IMRPhenomNSBH , IMRPhenomPv2, SEOBNRv4PHM, SEOBNRv4_ROM_NRTidalv2_NSbh , TaylorF2
GW190503_185404	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P
GW190512_180714	IMRPhenomD, IMRPhenomPv2, SEOBNRv4P, SEOBNRv4PHM
GW190513_205428	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190514_065416	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P
GW190517_055101	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190519_153544	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190521	IMRPhenomPv3HM , NRSur7dq4 , SEOBNRv4PHM
GW190521_074359	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190527_092055	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P
GW190602_175927	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190620_030421	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190630_185205	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190701_203306	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190706_222641	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190707_093326	IMRPhenomD, IMRPhenomPv2 , SEOBNRv4P , SEOBNRv4PHM
GW190708_232457	IMRPhenomD, IMRPhenomPv2, SEOBNRv4P, SEOBNRv4PHM
GW190719_215514	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190720_000836	IMRPhenomD, IMRPhenomPv2 , SEOBNRv4P , SEOBNRv4PHM
GW190727_060333	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P
GW190728_064510	IMRPhenomD, IMRPhenomPv2 , SEOBNRv4P , SEOBNRv4PHM
GW190731_140936	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P
GW190803_022701	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P
GW190814	IMRPhenomD, IMRPhenomHM, IMRPhenomNSBH, IMRPhenomPv3HM , SEOBNRv4HM_ROM, SEOBNRv4PHM , SEOBNRv4_ROM, SEOBNRv4_ROM_NRTidalv2_NSbh
GW190828_063405	IMRPhenomD, IMRPhenomPv2, NRSur7dq4 , SEOBNRv4P, SEOBNRv4PHM
GW190828_065509	IMRPhenomD, IMRPhenomPv2, SEOBNRv4P, SEOBNRv4PHM
GW190909_114149	IMRPhenomD, IMRPhenomPv2, SEOBNRv4P, SEOBNRv4PHM
GW190910_112807	IMRPhenomD, IMRPhenomPv2, SEOBNRv4P, SEOBNRv4PHM
GW190915_235702	IMRPhenomD, IMRPhenomPv2 , SEOBNRv4P , SEOBNRv4PHM
GW190924_021846	IMRPhenomD, IMRPhenomPv2 , SEOBNRv4P , SEOBNRv4PHM
GW190929_012149	IMRPhenomD, IMRPhenomPv2 , SEOBNRv4P , SEOBNRv4PHM
GW190930_133541	IMRPhenomD, IMRPhenomPv2 , SEOBNRv4P , SEOBNRv4PHM

TABLE VIII. Summary of the waveform models used for the analyses, available in the data release. Fiducial results used for the main presentation in Sec. VII are shown in bold. Where multiple bold waveforms are listed, equal numbers of posterior samples from runs with those waveforms are combined. For GW190425, HS and LS suffixes correspond to high spin ($|\vec{\chi}_i| \leq 0.89$) and low spin ($|\vec{\chi}_i| \leq 0.05$) priors respectively.

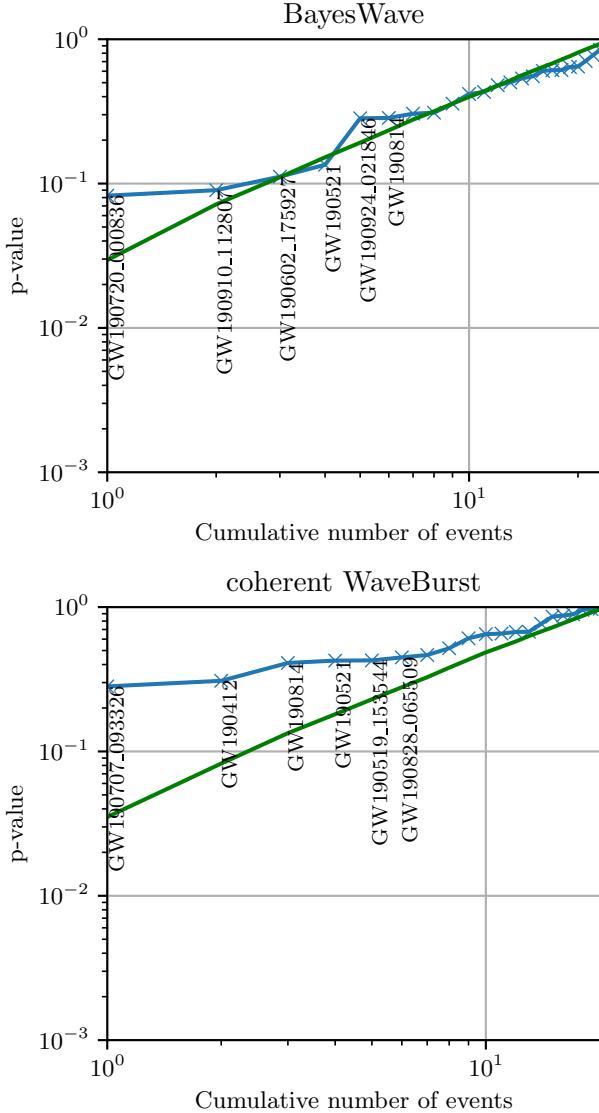


FIG. 12. P-value plot for the candidate events reconstructed by the minimally modeled pipelines in O3a. The upper panel is from the BW analysis and the lower panel is from the cWB analysis. The cWB analysis includes the candidate events that have been both detected and reconstructed (listed in Table IV), and those that have not been detected but have been reconstructed offline. (GW190513_205428, GW190707_093326, GW190728_064510, GW190814, GW190828_065509). The BW analysis uses the same selection of BBH candidate events as were used for testing general relativity [36]. The p-values are sorted in increasing order and plotted vs. the order number (which is also the cumulative number of candidate events). Each p-value is obtained from the observed on-source match value and the corresponding off-source distribution of the match values from off-source injections. The green band indicates the theoretical 90% symmetric distribution about the null hypothesis (dark green line). Only deviations below the green 90% confidence band indicate disagreement, and we see that there are none. A few of the cWB p-values are above the band, indicating either a statistical fluctuation, or an overfitting, which we attribute to a small asymmetry between the way the on-source and off-source matches are computed.

$$D_{\text{JS}}(\text{SEOBNRv4P}, \text{HM}) > D_{\text{JS}}(\text{SEOBNRv4P}, \text{IMRPhenomPv2}), \quad (\text{A4a})$$

$$D_{\text{JS}}(\text{SEOBNRv4P}, \text{HM}) > 0.007 \text{ bit}. \quad (\text{A4b})$$

When the conditions do not hold, we combine equal number of samples from the results of IMRPhenomPv2 and SEOBNRv4P and use the joint samples. The only exceptions are GW190425 and GW190426_152155, for which we use the tidal waveforms described in Sec. V, and GW190412, GW190521 and GW190814, for which we know HMs are significant [33, 34, 234]. Fig. 13 shows the JS divergences for every event (except GW190425, GW190426_152155, GW190521, and GW190814) to compare the effects of model systematics versus the effects of HMs. The gray regions correspond to the criteria in Eq. (A4a): any events with D_{JS} values in those regions are presented using HM results in Sec. VII.

2. Waveform comparison—Model systematics

The in-depth studies of GW190412, GW190521, and GW190814 have quantitatively demonstrated how much the choice of gravitational waveform impacts our interpretation of real gravitational wave events. We have identified several additional instances where analyses with our two fiducial precessing waveform models (IMRPhenomPv2 and SEOBNRv4P) have notable differences, as measured by the JS divergence.

To illustrate the impact of systematics, we show in Fig. 14 the posterior distributions for the events with extremal JS divergence in the key parameters q and χ_{eff} : GW190924_021846 and GW190521_074359. For GW190924_021846, SEOBNRv4P prefers more moderate mass ratios around 1/2, and shows only minor differences in the other parameters. Meanwhile, GW190521_074359 shows the largest differences in the effective inspiral spin, with SEOBNRv4P more clearly preferring non-zero values.

While the cases above demonstrate the moderate shifts that result from model systematics, for all the events presented in this paper, there is always substantial overlap between the posteriors for all the key quantities we consider. Therefore, systematic uncertainty remains subdominant to statistical uncertainty.

⁸ Our data release includes results from models with and without HMs.

3. Waveform comparison—Effect of higher-order multipole moments modes

Previous investigations of GW190412, GW190521, and GW190814 showed that gravitational wave radiation beyond the quadrupole can significantly impact our inferences on individual events [33, 34, 234]. Incorporating non-quadrupole modes enables tighter inferences on the source’s distance, component masses, and spins [195, 293, 296–308]. HMs impact inferences about even short-duration and low-amplitude sources, because of the weaker constraints our observations provide. For example, including non-quadrupole modes can tighten constraints on the source mass ratio for low-amplitude sources [296, 297], because high-mass ratio sources more efficiently produce non-quadrupole modes.

We systematically applied one or two models with HM to all sources in our catalog. We find that a majority of the sources investigated have modest shifts in mass ratio or χ_{eff} due to the impact of HMs.

To illustrate the impact of non-quadrupole modes, Fig. 15 shows posterior inferences on GW190519_153544, GW190602_175927, GW190706_222641, and GW190929_012149 using one or two independent models which include non-quadrupole modes (SEOBNRv4PHM and NRSur7dq4). Using more complete waveform models, the source of GW190519_153544 is inferred to be edge on, at a smaller distance, a more asymmetric mass ratio, and thus a higher source-frame mass m_1 . Due to this source’s favorable orientation, non-quadrupole modes have a significant impact, with a Bayes factor for HMs of ~ 15 . Similarly, non-quadrupole modes allow us to more strongly exclude both extreme and comparable mass ratios for the source responsible for GW190929_012149, and to disfavor comparable masses for GW190706_222641. Conversely, using the same two waveform models, the high-mass source responsible for GW190602_175927 is more confidently inferred to have mass ratio q closer to unity and therefore m_2 is skewed to larger values. Non-quadrupole modes also have a noticeable impact on parameters of GW190630_185205 and GW190828_065509, in particular the mass ratio and luminosity distance.

Appendix B: Waveform Consistency Tests

There are several different quantitative measures that can be used to measure waveform consistency. These include the residual SNR, which is found by subtracting the best-fit waveform template h_T from the data d , then

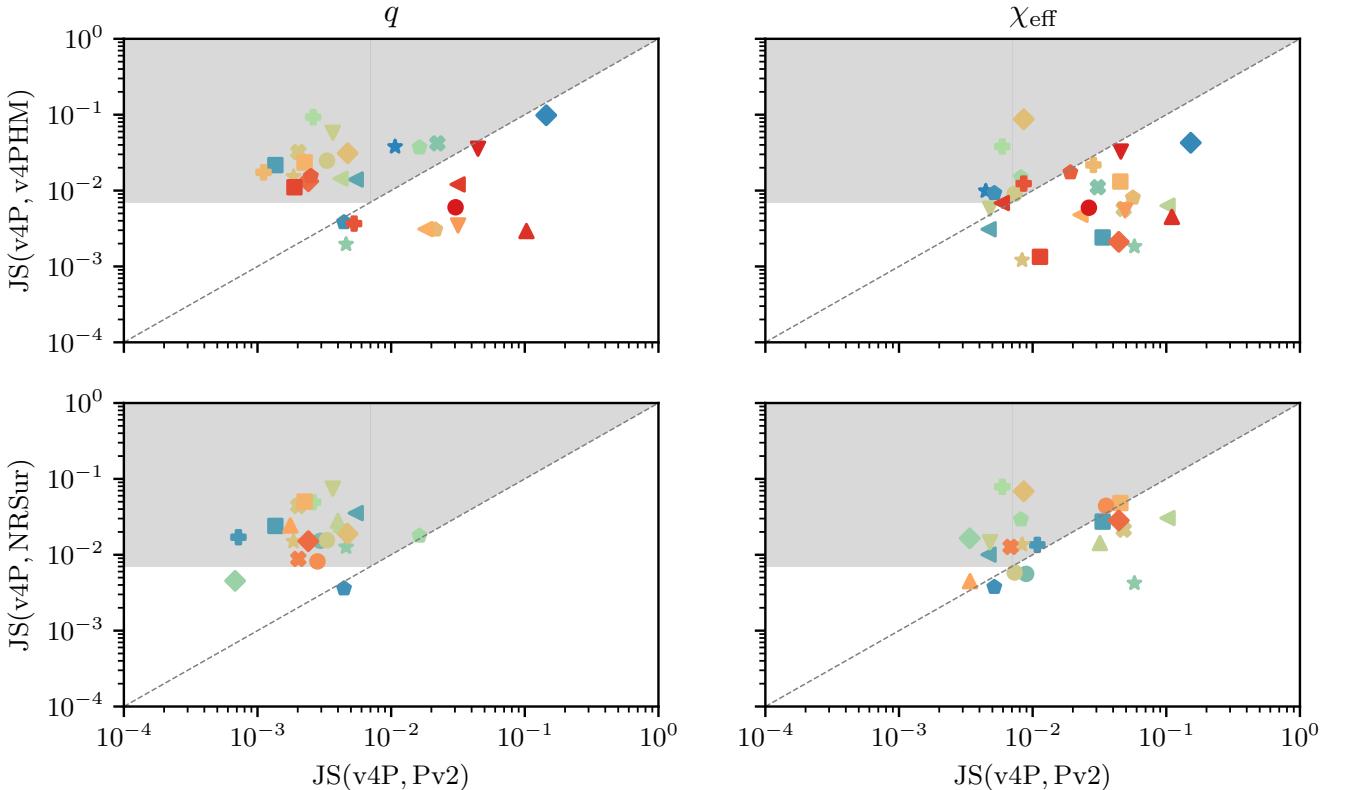


FIG. 13. Jensen–Shannon divergence D_{JS} of one-dimensional marginal distributions using different waveform models. The vertical axes show D_{JS} between one-dimensional posteriors using SEOBNRv4P and either SEOBNRv4PHM or NRSur7dq4. The horizontal axes show D_{JS} between one-dimensional posteriors using SEOBNRv4P and IMRPhenomPv2. The gray regions show the selection criteria from Eq. (A4a): any events in these regions are presented using higher-order multipole moment results in Sec. VII.

applying minimally-modeled methods to search for any coherent excess in the noise residual $r = d - h_T$. Additional measures of waveform consistency include the distance between waveforms, $\Delta^2 \langle h_1, h_2 \rangle = \langle h_1 - h_2 | h_1 - h_2 \rangle$ and the match, or overlap, $\mathcal{O} \langle h_1, h_2 \rangle$.

The residuals test has been applied as test of general relativity [9, 10], at least within the precision with which the waveform models approximate general relativity. Distance and match provide more sensitive measures of the waveform consistency than the residuals test since the extrinsic parameters of the source, such as the arrival

time, sky location and polarization, are constrained by the full signal, while for the residuals test the extrinsic parameters have to be constrained from the (usually small) difference between the signal and the template. To compare the signal reconstructions for the current catalog of sources we adopt the waveform match as our measure of waveform consistency since it does not depend on the overall amplitude of the signals, making it a convenient choice when comparing events with a range of amplitudes.

To make a quantitative assessment of the waveform

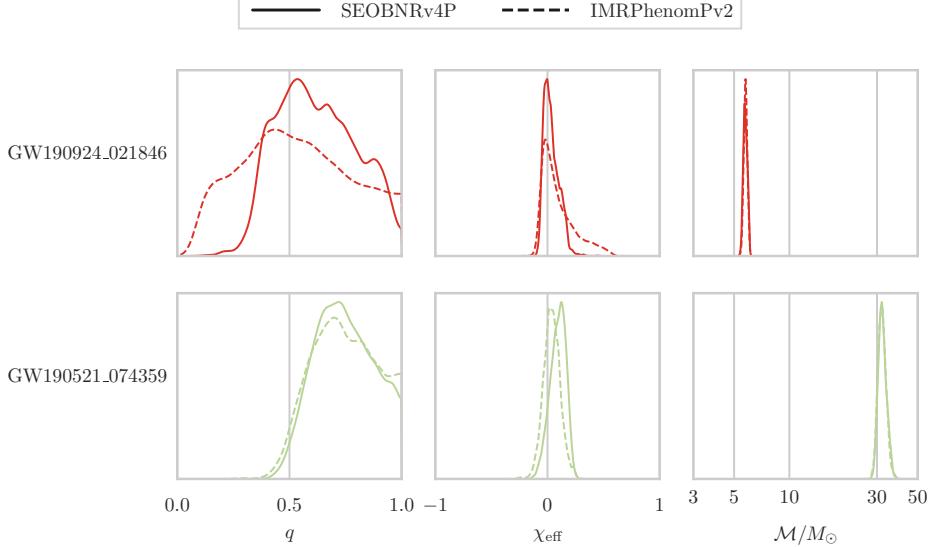


FIG. 14. Marginal posterior distributions on the mass ratio q , effective inspiral spin χ_{eff} , and source-frame chirp mass \mathcal{M} for GW190924_021846 and GW190521_074359, with the IMRPhenomPv2 and SEOBNRv4P waveform families.

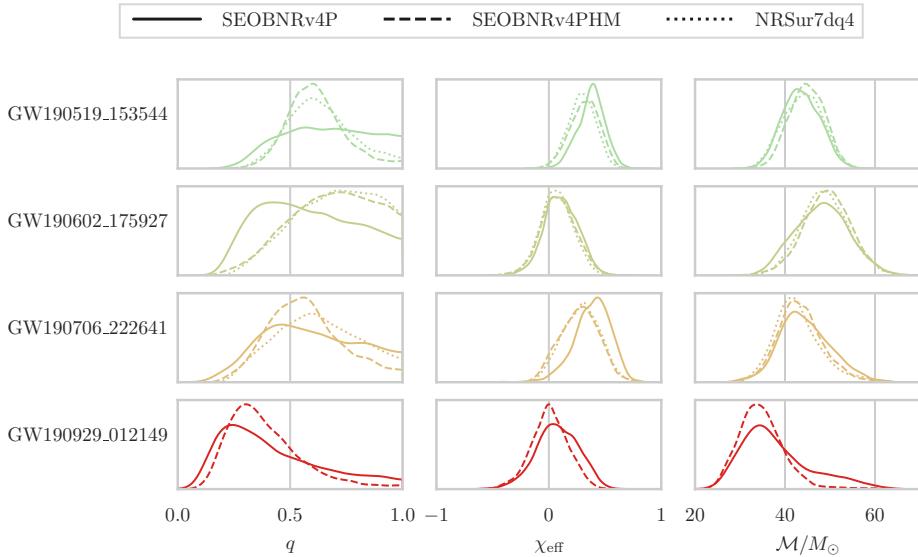


FIG. 15. Marginal posterior distributions on mass ratio q , effective inspiral spin χ_{eff} , and source-frame chirp mass \mathcal{M} , for GW190519_153544, GW190602_175927, GW190706_222641, and GW190929_012149 with the SEOBNRv4P, SEOBNRv4PHM, and NRSur7dq4 waveform families.

match values we need to know how the match depends on quantities such as the SNR and time–frequency volume of the signals. Instrument noise will lead to non-zero mis-matches, $\text{MM} = 1 - \mathcal{O}$, even when using perfect templates. For example, the maximum likelihood solution for a perfect template will have a mis-match with mean and variance given by [309]

$$\text{E}[\text{MM}] \simeq \frac{D-1}{2 \text{SNR}^2}, \quad \text{Var}[\text{MM}] \simeq \frac{D-1}{2 \text{SNR}^4}, \quad (\text{B1})$$

where D is the number of parameters that define the signal model, and where the reduction from D to $D-1$ is because the match is independent from the overall amplitude of the signal. For the minimally-modeled waveform reconstructions the distributions of match values are more difficult to predict. Using simulations it has been found that the mis-match decreases with SNR, but more slowly than for templates since the effective dimension of the model increases with SNR [107]. The mis-match

also scales with the time–frequency volume. For binary systems of a given SNR, the mis-match will generally be smaller for high mass systems [107, 310, 311]. Given these complexities, we chose to empirically estimate the match distribution from simulations for each event. As a proxy for the signal we use fair draws from the on-source template-based analysis and inject these into data surrounding the event; the right ascensions for the simulated signals are adjusted such that simulated source is at the same sky location in the frame of the detectors. For the majority of events the waveform model used for the injections is IMRPhenomPv2. The exceptions are GW190412, GW190521, GW190814 where IMRPhenomPv3HM was used.

The cWB and BW algorithms are used to produce point estimates for the waveform reconstructions for each of the simulated events. For cWB the point estimate is a constrained maximum likelihood reconstruction, while for BW the point estimate is the median of the waveform posterior distribution. Fig. 16 illustrates the results obtained for GW190519_153544. The upper panels compare the template-based LALInference waveform reconstruction in the LIGO Livingston detector to the minimally-modeled BW and cWB reconstructions. The solid lines are point estimates for the waveforms: for LALInference the maximum likelihood; for BW the median of posterior draws; and for cWB the constrained maximum likelihood. The panels also show the 90% credible bands for the Bayesian LALInference and BW algorithms and the 90% confidence band for cWB derived by injecting samples from the template based analysis into data surrounding the event and repeating the analysis multiple times (these bands are computed on an individual time sample basis). The lower panels of Fig. 16 show the distribution of overlaps found when running BW and cWB on simulated data with similar properties to the event. Waveforms drawn from the on-source LALInference analysis were injected into data surrounding the event. The overlap between the injected waveform and the point estimates from the BW and cWB analyses of these injections were then used to produce the histograms seen in Fig. 16. The distribution of the match values defines a null distribution for each detected event, which takes into account the variability of the LALInference posterior distribution, the fluctuations of the detector noise, and the waveform reconstruction errors. The fraction of off-source analyses with overlaps below the on-source match values, which are shown as vertical lines in the lower panels of Fig. 16, define the p-value for this event.

The same analysis procedure was repeated for a subset of additional events. cWB uses only events that are above the cWB search thresholds (resulting in a morphology-dependent SNR threshold which is about 7–10 for the events reported in this catalog), while for BW the analysis was restricted to events where the on-source BW analysis yielded $\text{SNR} > 7$. Fig. 17 shows the on-source match values vs. the off-source median match values with 90% intervals. The upper panel shows the results of the

BW analysis, while the lower panel shows the results of the cWB analysis. In both cases the p-values point to a good agreement between the minimally-modeled and template-based reconstructions.

The discrepancies between the two plots may be ascribed to different choices made in the two reconstruction algorithms. cWB is both a detection and a reconstruction pipeline. For this reason, reconstructions are performed with the same production settings used in searches. The production settings are optimized for noise rejection and to enforce strong network coherency constraints. To construct the match distributions, cWB uses about 2000–3000 waveform injections per event; however, those injections that are below the cWB thresholds are not reconstructed: in the majority of cases reported here (13) the reconstruction efficiency is greater than 80%, while in a few other cases (7) the efficiency ranges from 15% to 50%. For each event, this efficiency depends on the variability of the noise background. In cases of lower efficiency, we have also checked that the waveforms that are successfully reconstructed by cWB have parameter distributions that are statistically indistinguishable from those of the injected waveforms.

BW employs Bayesian inference to characterize detections made by the CBC and cWB search pipelines. As such, no cuts are made on the waveform reconstructions, which means that for quiet signals, some of the samples will be drawn from the prior distribution, resulting in a wide spread in the match distributions.

The distribution of match values for each event are used to compute p-values. The overall consistency of the template based and minimally-modeled waveform reconstructions can then be summarized by plotting the p-values, ranked in ascending order, against the theoretical distribution. In such plots, any significant deviations *below* the plot diagonal point to events that should undergo further analysis. The p-values for the events reconstructed by cWB and BW are shown in Fig. 12 in the main text. Applying the Fisher test [312] to the ensemble of p-values yields combined p-values of 0.57 for the BW analysis and 0.99 for the cWB analysis, indicating that there is no reason to reject the null hypothesis that the template based and minimally-modeled analysis are in agreement. The Fisher test is one-sided in that it only penalizes p-values that are lower than expected. The cWB analysis includes instances where the p-values are higher than predicted, indicating that the on-source matches are higher than expected based on the off-source distributions. The cause of this bias is likely due to an asymmetry between the on-source and off-source analyses. The on-source analysis computes the match between the maximum likelihood template-based waveform and its reconstruction, while the off-source analysis computes the match between the injected template and its reconstruction. Ideally the analysis would be symmetric, with the maximum likelihood template used both on-source and off-source, but the computational cost of running the full template-based analysis on the thousands of off-

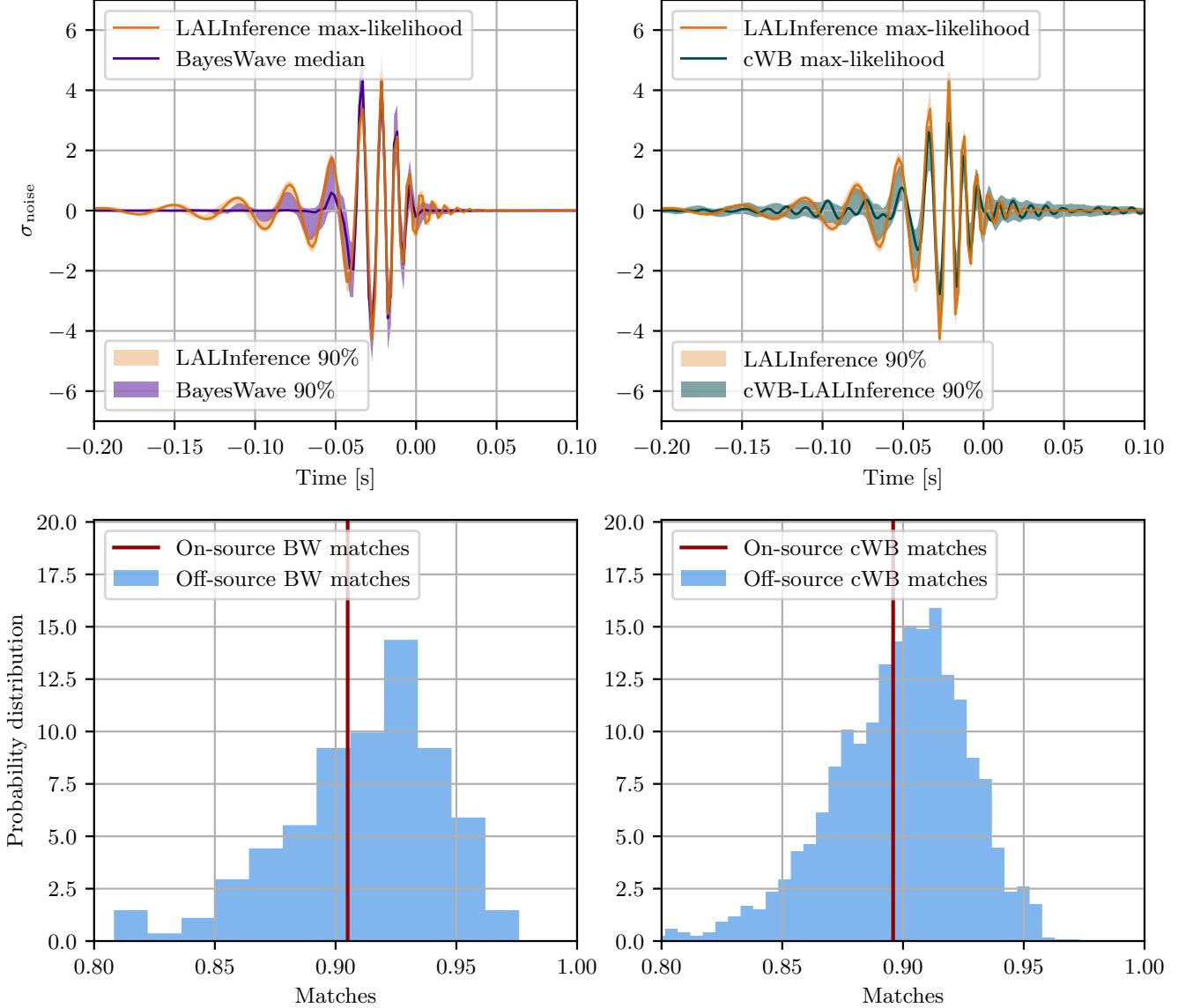


FIG. 16. The upper panels show waveform reconstructions for GW190519_153544 in the LIGO Livingston detector. The waveform posterior from the template-based analysis (shown in orange) is compared to the BW analysis in the upper left panel, and to the cWB analysis in the upper right panel. The panels also show the 90% credible bands for the Bayesian LALInference and BW algorithms and the 90% confidence band for cWB derived from off-source injections, i.e., by injecting samples from the template-based analysis into data surrounding the event and repeating the analysis multiple times (these bands are computed on an individual time sample basis). The lower two panels show the distribution of overlap values when running BW and cWB on waveforms drawn from the template based analysis that are injected into data surrounding the event. The fraction of runs with matches below that of the on-source analysis give the p-value for the event.

source injections is prohibitively expensive.

Appendix C: Cosmological distance resampling

For the luminosity distance, a prior that goes as D_L^2 is enforced in the sampling, following the same procedure as described in previous publications. As this assumption

becomes increasingly unrealistic as events are detected at greater distances, the posterior distributions shown in this paper are derived from a physically motivated prior that incorporates cosmological effects. We perform rejection sampling on the initial posterior samples to instead use a prior corresponding to a uniform merger rate per comoving volume in the rest frame of the source. Using a standard flat Λ CDM cosmology, samples are accepted

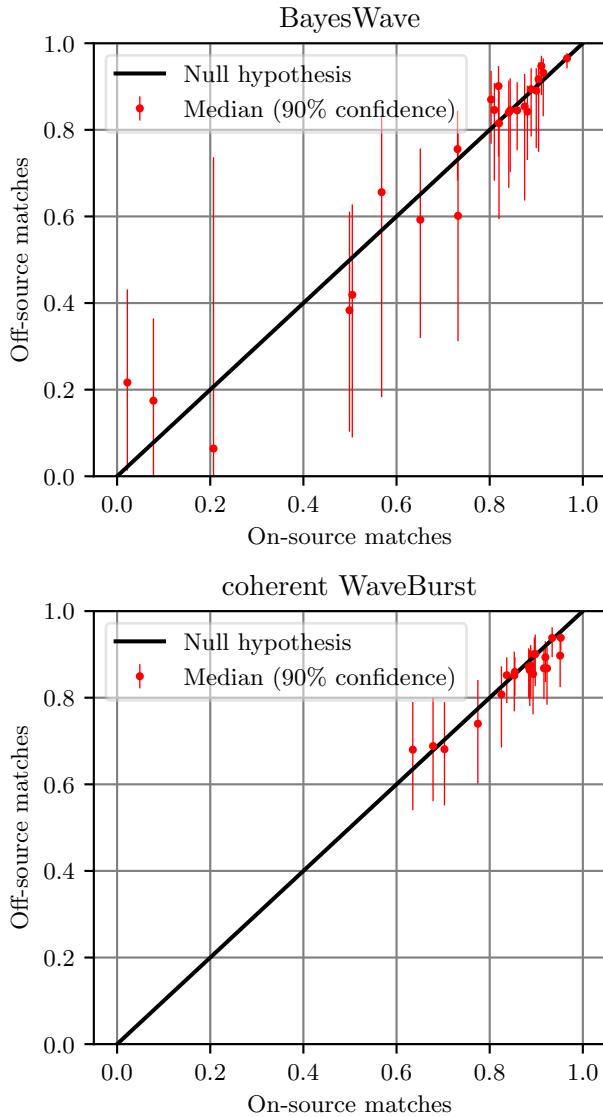


FIG. 17. Off-source vs. on-source match values for the candidate events in O3a. The upper panel displays the results of the BW analysis, and the lower panel shows the results of the cWB analysis. The on-source match on the horizontal axis is the value obtained comparing the maximum likelihood waveform from parameter estimation with point estimates from the minimally-modeled waveform reconstructions. The off-source match on the vertical axis is the median value of the match distribution obtained from off-source injection of sample waveforms from the template-based posterior distribution. In both panels, the errors bars denote the 90% equal-tailed confidence interval.

according to the weight

$$\begin{aligned}
 w(z) &\propto \frac{1}{(1+z)} \frac{dV_c}{dV_E} \\
 &\propto (1+z)^{-2} \left(\frac{D_L E(z)}{D_H} + (1+z)^2 \right)^{-1}.
 \end{aligned} \tag{C1}$$

The initial $1/(1+z)$ factor accounts for time dilation of the observed merger rate, dV_c is the comoving volume element, and $dV_E = D_L^2 d\Omega$ is the Euclidean volume element. $D_H = c/H_0$ is the Hubble distance and $E(z) \simeq \sqrt{\Omega_m(1+z)^3 + \Omega_\Lambda}$ for Λ CDM, and we use Hubble constant $H_0 = 67.9 \text{ km s}^{-1} \text{ Mpc}^{-1}$ and matter density $\Omega_m = 0.3065 = 1 - \Omega_\Lambda$ [236].

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- [1] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Observation of Gravitational Waves from a Binary Black Hole Merger, *Phys. Rev. Lett.* **116**, 061102 (2016), arXiv:1602.03837 [gr-qc].
- [2] J. Aasi *et al.* (LIGO Scientific Collaboration), Advanced LIGO, *Class. Quantum Grav.* **32**, 074001 (2015), arXiv:1411.4547 [gr-qc].
- [3] F. Acernese *et al.* (Virgo Collaboration), Advanced Virgo: a second-generation interferometric gravitational wave detector, *Class. Quantum Grav.* **32**, 024001 (2015), arXiv:1408.3978 [gr-qc].
- [4] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW151226: Observation of Gravitational Waves from a 22-Solar-Mass Binary Black Hole Coalescence, *Phys. Rev. Lett.* **116**, 241103 (2016), arXiv:1606.04855 [gr-qc].
- [5] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW170104: Observation of a 50-Solar-Mass Binary Black Hole Coalescence at Redshift 0.2, *Phys. Rev. Lett.* **118**, 221101 (2017), [Erratum: *Phys. Rev. Lett.* **121**, 129901 (2018)], arXiv:1706.01812 [gr-qc].
- [6] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW170608: Observation of a 19-solar-mass Binary Black Hole Coalescence, *Astrophys. J.* **851**, L35 (2017), arXiv:1711.05578 [astro-ph.HE].
- [7] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW170814: A Three-Detector Observation of Gravitational Waves from a Binary Black Hole Coalescence, *Phys. Rev. Lett.* **119**, 141101 (2017), arXiv:1709.09660 [gr-qc].
- [8] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GWTC-1: A Gravitational-Wave Transient Catalog of Compact Binary Mergers Observed by LIGO and Virgo during the First and Second Observing Runs, *Phys. Rev. X* **9**, 031040 (2019), arXiv:1811.12907 [astro-ph.HE].
- [9] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Tests of general relativity with GW150914, *Phys. Rev. Lett.* **116**, 221101 (2016), [Erratum: *Phys. Rev. Lett.* **121**, 129902 (2018)], arXiv:1602.03841 [gr-qc].
- [10] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Tests of General Relativity with the Binary Black Hole Signals from the LIGO-Virgo Catalog GWTC-1, *Phys. Rev. D* **100**, 104036 (2019), arXiv:1903.04467 [gr-qc].
- [11] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Binary Black Hole Population Properties Inferred from the First and Second Observing Runs of Advanced LIGO and Advanced Virgo, *Astrophys. J.* **882**, L24 (2019), arXiv:1811.12940 [astro-ph.HE].
- [12] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW170817: Observation of Gravitational Waves from a Binary Neutron Star Inspiral, *Phys. Rev. Lett.* **119**, 161101 (2017), arXiv:1710.05832 [gr-qc].
- [13] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration, Fermi-GBM, INTEGRAL), Gravitational Waves and Gamma-rays from a Binary Neutron Star Merger: GW170817 and GRB 170817A, *Astrophys. J.* **848**, L13 (2017), arXiv:1710.05834 [astro-ph.HE].
- [14] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration, Fermi GBM, INTEGRAL, IceCube, AstroSat Cadmium Zinc Telluride Imager Team, IPN, Insight-Hxmt, ANTARES, Swift, AGILE Team, 1M2H Team, Dark Energy Camera GW-EM, DES, DLT40, GRAWITA, Fermi-LAT, ATCA, ASKAP, Las Cumbres Observatory Group, OzGrav, DWF (Deeper Wider Faster Program), AST3, CAASTRO, VINROUGE, MASTER, J-GEM, GROWTH, JAGWAR, CaltechNRAO, TTU-NRAO, NuSTAR, Pan-STARRS, MAXI Team, TZAC Consortium, KU, Nordic Optical Telescope, ePESSTO, GROND, Texas Tech University, SALT Group, TOROS, BOOTES, MWA, CALET, IKI-GW Follow-up, H.E.S.S., LOFAR, LWA, HAWC, Pierre Auger, ALMA, Euro VLBI Team, Pi of Sky, Chandra Team at McGill University, DFN, ATLAS Telescopes, High Time Resolution Universe Survey, RIMAS, RATIR, SKA South Africa/MeerKAT), Multi-messenger Observations of a Binary Neutron Star Merger, *Astrophys. J.* **848**, L12 (2017), arXiv:1710.05833 [astro-ph.HE].
- [15] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW170817: Measurements of neutron star radii and equation of state, *Phys. Rev. Lett.* **121**, 161101 (2018), arXiv:1805.11581 [gr-qc].
- [16] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Model comparison from LIGO-Virgo data on GW170817's binary components and consequences for the merger remnant, *Class. Quantum Grav.* **37**, 045006 (2020), arXiv:1908.01012 [gr-qc].
- [17] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration, 1M2H, Dark Energy Camera GW-E, DES, DLT40, Las Cumbres Observatory, VINROUGE, MASTER), A gravitational-wave standard siren measurement of the Hubble constant, *Nature* **551**, 85 (2017), arXiv:1710.05835 [astro-ph.CO].
- [18] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), A gravitational-wave measurement of the Hubble constant following the second observing run of Advanced LIGO and Virgo (2019), arXiv:1908.06060 [astro-ph.CO].
- [19] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Tests of General Relativity with GW170817, *Phys. Rev. Lett.* **123**, 011102 (2019), arXiv:1811.00364 [gr-qc].
- [20] R. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Open data from the first and second observing runs of Advanced LIGO and Advanced Virgo (2019), arXiv:1912.11716 [gr-qc].
- [21] A. Trovato (LIGO Scientific Collaboration, Virgo Collaboration), GWOSC: Gravitational Wave Open Science Center, *Proceedings, The New Era of Multi-Messenger Astrophysics (ASTERICS 2019): Groningen, Netherlands, March 25-29, 2019*, PoS **Asterics2019**, 082 (2020).
- [22] B. Zackay, L. Dai, T. Venumadhav, J. Roulet, and M. Zaldarriaga, Detecting Gravitational Waves With Disparate Detector Responses: Two New Binary Black Hole Mergers (2019), arXiv:1910.09528 [astro-ph.HE].

- [23] T. Venumadhav, B. Zackay, J. Roulet, L. Dai, and M. Zaldarriaga, New binary black hole mergers in the second observing run of Advanced LIGO and Advanced Virgo, *Phys. Rev. D* **101**, 083030 (2020), arXiv:1904.07214 [astro-ph.HE].
- [24] T. Venumadhav, B. Zackay, J. Roulet, L. Dai, and M. Zaldarriaga, New search pipeline for compact binary mergers: Results for binary black holes in the first observing run of Advanced LIGO, *Phys. Rev. D* **100**, 023011 (2019), arXiv:1902.10341 [astro-ph.IM].
- [25] B. Zackay, T. Venumadhav, L. Dai, J. Roulet, and M. Zaldarriaga, Highly spinning and aligned binary black hole merger in the Advanced LIGO first observing run, *Phys. Rev. D* **100**, 023007 (2019), arXiv:1902.10331 [astro-ph.HE].
- [26] A. H. Nitz, C. Capano, A. B. Nielsen, S. Reyes, R. White, D. A. Brown, and B. Krishnan, 1-OGC: The first open gravitational-wave catalog of binary mergers from analysis of public Advanced LIGO data, *Astrophys. J.* **872**, 195 (2019), arXiv:1811.01921 [gr-qc].
- [27] A. H. Nitz, T. Dent, G. S. Davies, S. Kumar, C. D. Capano, I. Harry, S. Mozzon, L. Nuttall, A. Lundgren, and M. Tápai, 2-OGC: Open Gravitational-wave Catalog of binary mergers from analysis of public Advanced LIGO and Virgo data, *Astrophys. J.* **891**, 123 (2019), arXiv:1910.05331 [astro-ph.HE].
- [28] R. Magee *et al.*, Sub-threshold Binary Neutron Star Search in Advanced LIGO’s First Observing Run, *Astrophys. J.* **878**, L17 (2019), arXiv:1901.09884 [gr-qc].
- [29] B. Allen, W. G. Anderson, P. R. Brady, D. A. Brown, and J. D. E. Creighton, FINDCHIRP: An Algorithm for detection of gravitational waves from inspiraling compact binaries, *Phys. Rev. D* **85**, 122006 (2012), arXiv:gr-qc/0509116 [gr-qc].
- [30] H.-Y. Chen, D. E. Holz, J. Miller, M. Evans, S. Vitale, and J. Creighton, Distance measures in gravitational-wave astrophysics and cosmology (2017), arXiv:1709.08079 [astro-ph.CO].
- [31] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25871**, **25829**, **25753**, **25503**, **25497**, **25324**, **25187**, **25164**, **25115**, **25012**, **24998**, **24950**, **24922**, **24717**, **24632**, **24621**, **24598**, **24570**, **24522**, **24503**, **24377**, **24237**, **24168**, **24141**, **24098**, **24069** (2019).
- [32] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW190425: Observation of a Compact Binary Coalescence with Total Mass $\sim 3.4M_{\odot}$, *Astrophys. J. Lett.* **892**, L3 (2020), arXiv:2001.01761 [astro-ph.HE].
- [33] R. Abbott *et al.* (LIGO Scientific, Virgo), GW190814: Gravitational Waves from the Coalescence of a 23 Solar Mass Black Hole with a 2.6 Solar Mass Compact Object, *Astrophys. J.* **896**, L44 (2020), arXiv:2006.12611 [astro-ph.HE].
- [34] R. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW190521: A Binary Black Hole Merger with a Total Mass of $150 M_{\odot}$, *Phys. Rev. Lett.* **125**, 101102 (2020), arXiv:2009.01075 [gr-qc].
- [35] R. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Properties and astrophysical implications of the $150 M_{\odot}$ binary black hole merger GW190521, *Astrophys. J. Lett.* **900**, L13 (2020), arXiv:2009.01190 [astro-ph.HE].
- [36] LIGO and V. Collaborations, Tests of General Relativity with Binary Black Holes from the second LIGO–Virgo Gravitational-Wave Transient Catalog, *LIGO DCC P2000091*, 1 (2020).
- [37] LIGO and V. Collaborations, Population properties of compact objects from the second LIGO–Virgo Gravitational-Wave Transient Catalog, *LIGO DCC P2000077*, 1 (2020).
- [38] LIGO Scientific Collaboration and Virgo Collaboration, *GWTC-2 data release* (2020).
- [39] G. Vajente, E. K. Gustafson, and D. H. Reitze, Chapter three - precision interferometry for gravitational wave detection: Current status and future trends (Academic Press, 2019) pp. 75 – 148.
- [40] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Binary Black Hole Mergers in the first Advanced LIGO Observing Run, *Phys. Rev. X* **6**, 041015 (2016), [*Erratum: Phys. Rev. X* **8**, 039903 (2018)], arXiv:1606.04856 [gr-qc].
- [41] A. Buikema *et al.* (aLIGO), Sensitivity and Performance of the Advanced LIGO Detectors in the Third Observing Run, *Phys. Rev. D* **102**, 062003 (2020), arXiv:2008.01301 [astro-ph.IM].
- [42] J. C. Driggers *et al.* (LIGO Scientific Collaboration), Improving astrophysical parameter estimation via off-line noise subtraction for Advanced LIGO, *Phys. Rev. D* **99**, 042001 (2019), arXiv:1806.00532 [astro-ph.IM].
- [43] G. Billingsley, H. Yamamoto, and L. Zhang, Characterization of Advanced LIGO Core Optics, *Proceedings American Society for Precision Engineering (ASPE) 2017 Spring Topical Meeting Volume* **66**, 78 (2017).
- [44] R. Dolesi, M. Hueller, D. Nicolodi, D. Tombolato, S. Vitale, P. J. Wass, W. J. Weber, M. Evans, P. Fritschel, R. Weiss, J. H. Gundlach, C. A. Hagedorn, S. Schlamminger, G. Ciani, and A. Cavalleri, Brownian force noise from molecular collisions and the sensitivity of advanced gravitational wave observatories, *Phys. Rev. D* **84**, 063007 (2011).
- [45] A. Brooks, *Point absorbers in Advanced LIGO*.
- [46] M. Evans, S. Gras, P. Fritschel, J. Miller, L. Barsotti, D. Martynov, A. Brooks, D. Coyne, R. Abbott, R. X. Adhikari, K. Arai, R. Bork, B. Kells, J. Rollins, N. Smith-Lefebvre, G. Vajente, H. Yamamoto, C. Adams, S. Aston, J. Betzweiser, V. Frolov, A. Mullavey, A. Pele, J. Romie, M. Thomas, K. Thorne, S. Dwyer, K. Izumi, K. Kawabe, D. Sigg, R. Derosa, A. Effler, K. Kokeyama, S. Ballmer, T. J. Massinger, A. Staley, M. Heinze, C. Mueller, H. Grote, R. Ward, E. King, D. Blair, L. Ju, and C. Zhao, Observation of Parametric Instability in Advanced LIGO, *Phys. Rev. Lett.* **114**, 161102 (2015), arXiv:1502.06058 [astro-ph.IM].
- [47] S. Biscans, S. Gras, C. D. Blair, J. Driggers, M. Evans, P. Fritschel, T. Hardwick, and G. Mansell, Suppressing parametric instabilities in LIGO using low-noise acoustic mode dampers, *Phys. Rev. D* **100**, 122003 (2019), arXiv:1909.07805 [physics.app-ph].
- [48] R. Schnabel, N. Mavalvala, D. E. McClelland, and P. K. Lam, Quantum metrology for gravitational wave astronomy, *Nature Commun.* **1**, 121 (2010).
- [49] L. Barsotti, J. Harms, and R. Schnabel, Squeezed vacuum states of light for gravitational wave detectors, *Rept. Prog. Phys.* **82**, 016905 (2019).
- [50] M. Tse *et al.*, Quantum-Enhanced Advanced LIGO Detectors in the Era of Gravitational-Wave Astronomy,

- Phys. Rev. Lett.* **123**, 231107 (2019).
- [51] J. Abadie *et al.* (LIGO Scientific), A Gravitational wave observatory operating beyond the quantum shot-noise limit: Squeezed light in application, *Nature Phys.* **7**, 962 (2011), arXiv:1109.2295 [quant-ph].
- [52] H. Grote, K. Danzmann, K. L. Dooley, R. Schnabel, J. Slutsky, and H. Vahlbruch, First Long-Term Application of Squeezed States of Light in a Gravitational-Wave Observatory, *Phys. Rev. Lett.* **110**, 181101 (2013), arXiv:1302.2188 [physics.ins-det].
- [53] D. J. Ottaway, P. Fritschel, and S. J. Waldman, Impact of upconverted scattered light on advanced interferometric gravitational wave detectors, *Opt. Express* **20**, 8329 (2012).
- [54] D. Aisa *et al.*, The Advanced Virgo monolithic fused silica suspension, *Proceedings, 13th Pisa Meeting on Advanced Detectors : Frontier Detectors for Frontier Physics (FDPP 2015): La Biodola, Isola d'Elba, Italy, 2015*, *Nucl. Instrum. Meth.* **A824** (2016).
- [55] L. Naticchioni (Virgo Collaboration), The payloads of Advanced Virgo: current status and upgrades, *Proceedings, 12th Edoardo Amaldi Conference on Gravitational Waves (Amaldi 12): Pasadena, CA, USA, 2017*, *J. Phys. Conf. Ser.* **957**, 012002 (2018).
- [56] M. Blom *et al.*, Vertical and Horizontal Seismic Isolation Performance of the Advanced Virgo External Injection Bench Seismic Attenuation System, *Proceedings, 13th International Conference on Topics in Astroparticle and Underground Physics (TAUP 2013): Asilomar, CA, USA, 2013*, *Phys. Procedia* **61** (2015).
- [57] M. Blom, Seismic Attenuation for Advanced Virgo: Vibration Isolation for the External Injection Bench, *Ph.D. Thesis, Nikhef* (2015).
- [58] F. Acernese *et al.* (Virgo), Calibration of Advanced Virgo and Reconstruction of the Gravitational Wave Signal $h(t)$ during the Observing Run O2, *Class. Quant. Grav.* **35**, 205004 (2018), arXiv:1807.03275 [gr-qc].
- [59] A. Rocchi *et al.*, Thermal effects and their compensation in Advanced Virgo, *Proceedings, 9th Edoardo Amaldi Conference on Gravitational Waves (Amaldi 9): Cardiff, United Kingdom, 2011*, *J. Phys. Conf. Ser.* **363**, 012016 (2012).
- [60] I. Nardecchia *et al.*, Integrated dynamical thermal compensation techniques for Advanced Virgo, in *Proceedings, 2nd Gravitational-waves Science and technology Symposium (GRASS 2019): Padova, Italy, 2019* (2020).
- [61] F. Acernese *et al.* (Virgo Collaboration), Increasing the Astrophysical Reach of the Advanced Virgo Detector via the Application of Squeezed Vacuum States of Light, *Phys. Rev. Lett.* **123**, 231108 (2019).
- [62] H. Vahlbruch, M. Mehmet, K. Danzmann, and R. Schnabel, Detection of 15 dB Squeezed States of Light and their Application for the Absolute Calibration of Photoelectric Quantum Efficiency, *Phys. Rev. Lett.* **117**, 110801 (2016).
- [63] B. P. Abbott *et al.* (LIGO Scientific, Virgo), A guide to LIGO–Virgo detector noise and extraction of transient gravitational-wave signals, *Class. Quantum Grav.* **37**, 055002 (2020), arXiv:1908.11170 [gr-qc].
- [64] R. P. Fisher *et al.*, DQSEGDB: A time-interval database for storing gravitational wave observatory metadata (2020), arXiv:2008.11316 [astro-ph.IM].
- [65] N. Christensen, P. Shawhan, and G. Gonzalez (LIGO Scientific), Vetoes for inspiral triggers in LIGO data, *Class. Quantum Grav.* **21**, S1747 (2004), arXiv:gr-qc/0403114.
- [66] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Characterization of transient noise in Advanced LIGO relevant to gravitational wave signal GW150914, *Class. Quantum Grav.* **33**, 134001 (2016), arXiv:1602.03844 [gr-qc].
- [67] A. Viets *et al.*, Reconstructing the calibrated strain signal in the Advanced LIGO detectors, *Class. Quant. Grav.* **35**, 095015 (2018), arXiv:1710.09973 [astro-ph.IM].
- [68] F. Acernese *et al.* (Virgo), Calibration of Advanced Virgo and Reconstruction of the Gravitational Wave Signal $h(t)$ during the Observing Run O2, *Class. Quantum Grav.* **35**, 205004 (2018), arXiv:1807.03275 [gr-qc].
- [69] B. P. Abbott *et al.* (LIGO Scientific Collaboration), Calibration of the Advanced LIGO detectors for the discovery of the binary black-hole merger GW150914, *Phys. Rev. D* **95**, 062003 (2017), arXiv:1602.03845 [gr-qc].
- [70] D. Tuyenbayev *et al.*, Improving LIGO calibration accuracy by tracking and compensating for slow temporal variations, *Class. Quant. Grav.* **34**, 015002 (2017), arXiv:1608.05134 [astro-ph.IM].
- [71] S. Karki *et al.*, The Advanced LIGO Photon Calibrators, *Rev. Sci. Instrum.* **87**, 114503 (2016), arXiv:1608.05055 [astro-ph.IM].
- [72] D. Bhattacharjee, Y. Lecoeuche, S. Karki, J. Bettwieser, V. Bossilkov, S. Kandhasamy, E. Payne, and R. Savage, Fiducial displacements with improved accuracy for the global network of gravitational wave detectors, *Class. Quantum Grav.* **10.1088/1361-6382/aba9ed** (2020), arXiv:2006.00130 [astro-ph.IM].
- [73] D. Estevez, P. Lagabbe, A. Masserot, L. Rolland, M. Seglar-Arroyo, and D. Verkindt, The Advanced Virgo Photon Calibrators (2020), arXiv:2009.08103 [astro-ph.IM].
- [74] L. Sun *et al.*, Characterization of systematic error in Advanced LIGO calibration, *Class. Quant. Grav.* **37**, 225008 (2020), arXiv:2005.02531 [astro-ph.IM].
- [75] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), GW150914: First results from the search for binary black hole coalescence with Advanced LIGO, *Phys. Rev. D* **93**, 122003 (2016), arXiv:1602.03839 [gr-qc].
- [76] S. Vitale, W. Del Pozzo, T. G. F. Li, C. Van Den Broeck, I. Mandel, B. Aylott, and J. Veitch, Effect of calibration errors on Bayesian parameter estimation for gravitational wave signals from inspiral binary systems in the Advanced Detectors era, *Phys. Rev. D* **85**, 064034 (2012), arXiv:1111.3044 [gr-qc].
- [77] D. Estevez, B. Mouris, L. Rolland, and D. Verkindt, *Online $h(t)$ reconstruction for Virgo O3 data: start of O3*, Tech. Rep. VIR-0652B-19 (Virgo, 2019).
- [78] D. Davis, T. J. Massinger, A. P. Lundgren, J. C. Driggers, A. L. Urban, and L. K. Nuttall, Improving the Sensitivity of Advanced LIGO Using Noise Subtraction, *Class. Quantum Grav.* **36**, 055011 (2019), arXiv:1809.05348 [astro-ph.IM].
- [79] A. Viets and M. Wade, *CSubtracting Narrow-band Noise from LIGO Strain Data in the Third Observing Run*, Tech. Rep. T2100058 (LIGO DCC, 2021).
- [80] G. Vajente, Y. Huang, M. Isi, J. C. Driggers, J. S. Kissel, M. J. Szczepanczyk, and S. Vitale, Machine-learning nonstationary noise out of gravitational-wave detectors,

- Phys. Rev. D **101**, 042003 (2020), arXiv:1911.09083 [gr-qc].
- [81] L. Rolland, M. Seglar-Arroyo, and D. Verkindt, *Reprocessing of $h(t)$ for the last two weeks of O3a*, Tech. Rep. VIR-1201A-19 (Virgo, 2019).
- [82] D. Davis *et al.*, LIGO Detector Characterization in the Second and Third Observing Runs (2021), arXiv:2101.11673 [astro-ph.IM].
- [83] D. Macleod, A. L. Urban, M. Isi, T. M. paulaltn, M. Pitkin, and A. Nitz, *gwpy/gwsumm: 1.0.2* (2019).
- [84] F. Robinet, *Omicron: An Algorithm to Detect and Characterize Transient Noise in Gravitational-Wave Detectors*, Tech. Rep. VIR-0545C-14 (Virgo, 2015).
- [85] F. Robinet *et al.*, Omicron: a tool to characterize transient noise in gravitational-wave detectors (2020), arXiv:2007.11374 [astro-ph.IM].
- [86] T. Accadia *et al.*, Noise from scattered light in Virgo’s second science run data, *Proceedings, 14th Workshop on Gravitational wave data analysis (GWDAW-14): Rome, Italy, January 26-29, 2010*, Class. Quantum Grav. **27**, 194011 (2010).
- [87] E. Flanagan and K. Thorne, *Noise Due to Backscatter Off Baffles, the Nearby Wall, and Objects at the Far end of the Beam Tube, and Recommended Actions*, Tech. Rep. LIGO-T940063-00-R (LIGO, 1994).
- [88] S. Soni *et al.* (LIGO), Reducing scattered light in LIGO’s third observing run, Class. Quant. Grav. **38**, 025016 (2020), arXiv:2007.14876 [astro-ph.IM].
- [89] M. Cabero *et al.*, Blip glitches in Advanced LIGO data, Class. Quantum Grav. **36**, 155010 (2019), arXiv:1901.05093 [physics.ins-det].
- [90] D. Davis, L. V. White, and P. R. Saulson, Utilizing aLIGO Glitch Classifications to Validate Gravitational-Wave Candidates, Class. Quantum Grav. **37**, 145001 (2020), arXiv:2002.09429 [gr-qc].
- [91] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Effects of data quality vetoes on a search for compact binary coalescences in Advanced LIGO’s first observing run, Class. Quantum Grav. **35**, 065010 (2018), arXiv:1710.02185 [gr-qc].
- [92] P. Godwin *et al.*, *Incorporation of Statistical Data Quality Information into the GstLAL Search Analysis*, Tech. Rep. P2000117 (LSC, 2020).
- [93] R. Essick, P. Godwin, C. Hanna, L. Blackburn, and E. Katsavounidis, iDQ: Statistical Inference of Non-Gaussian Noise with Auxiliary Degrees of Freedom in Gravitational-Wave Detectors (2020), arXiv:2005.12761 [astro-ph.IM].
- [94] S. Chatterji, L. Blackburn, G. Martin, and E. Katsavounidis, Multiresolution techniques for the detection of gravitational-wave bursts, *8th Gravitational Wave Data Analysis Workshop (GWDAW 2003) Milwaukee, Wisconsin, December 17-20, 2003*, Class. Quantum Grav. **21**, S1809 (2004), arXiv:gr-qc/0412119 [gr-qc].
- [95] M. Zevin *et al.*, Gravity Spy: Integrating Advanced LIGO Detector Characterization, Machine Learning, and Citizen Science, Class. Quantum Grav. **34**, 064003 (2017), arXiv:1611.04596 [gr-qc].
- [96] S. Mozzon, L. Nuttall, A. Lundgren, S. Kumar, A. Nitz, and T. Dent, Dynamic Normalization for Compact Binary Coalescence Searches in Non-Stationary Noise (2020), arXiv:2002.09407 [astro-ph.IM].
- [97] J. S. Areeda, J. R. Smith, A. P. Lundgren, E. Maros, D. M. Macleod, and J. Zweizig, LigoDV-web: Providing easy, secure and universal access to a large distributed scientific data store for the LIGO Scientific Collaboration, Astron. Comput. **18**, 27 (2017), arXiv:1611.01089 [astro-ph.IM].
- [98] D. Verkindt, *The Virgo dataDisplay*, Tech. Rep. VIR-0237A-15 (Virgo, 2015).
- [99] D. Verkindt, Advanced Virgo: from detector monitoring to gravitational wave alerts, in *54th Rencontres de Moriond on Gravitation (Moriond Gravitation 2019) La Thuile, Italy, March 23-30, 2019* (2019) p. 57.
- [100] A. Effler, R. M. S. Schofield, V. V. Frolov, G. González, K. Kawabe, J. R. Smith, J. Birch, and R. McCarthy, Environmental Influences on the LIGO Gravitational Wave Detectors during the 6th Science Run, Class. Quantum Grav. **32**, 035017 (2015), arXiv:1409.5160 [astro-ph.IM].
- [101] P. Nguyen *et al.*, Environmental Noise in Advanced LIGO Detectors (2021), arXiv:2101.09935 [astro-ph.IM].
- [102] G. Hemming and D. Verkindt, *Virgo Interferometer Monitor (VIM) Web User Interface (WUI) User Guide*, Tech. Rep. VIR-0546A-16 (Virgo, 2016).
- [103] G. Hemming and D. Verkindt, *Virgo Interferometer Monitor (VIM) Plot generator users guide*, Tech. Rep. VIR-0554A-16 (Virgo, 2016).
- [104] J. R. Smith, T. Abbott, E. Hirose, N. Leroy, D. Macleod, J. McIver, P. Saulson, and P. Shawhan, A Hierarchical method for vetoing noise transients in gravitational-wave detectors, Class. Quantum Grav. **28**, 235005 (2011), arXiv:1107.2948 [gr-qc].
- [105] T. Isogai (LIGO Scientific Collaboration, Virgo Collaboration), Used percentage veto for LIGO and virgo binary inspiral searches, *Proceedings, 14th Workshop on Gravitational wave data analysis (GWDAW-14): Rome, Italy, January 26-29, 2010*, J. Phys. Conf. Ser. **243**, 012005 (2010).
- [106] N. J. Cornish and T. B. Littenberg, Bayeswave: Bayesian inference for gravitational wave bursts and instrument glitches, Class. Quantum Grav. **32**, 135012 (2015), arXiv:1410.3835 [gr-qc].
- [107] T. B. Littenberg, J. B. Kanner, N. J. Cornish, and M. Millhouse, Enabling high confidence detections of gravitational-wave bursts, Phys. Rev. D **94**, 044050 (2016), arXiv:1511.08752 [gr-qc].
- [108] N. J. Cornish, T. B. Littenberg, B. Bécsy, K. Chatzioannou, J. A. Clark, S. Ghonge, and M. Millhouse, The BayesWave analysis pipeline in the era of gravitational wave observations, Phys. Rev. D **103**, 044006 (2021), arXiv:2011.09494 [gr-qc].
- [109] C. Pankow *et al.*, Mitigation of the instrumental noise transient in gravitational-wave data surrounding GW170817, Phys. Rev. D **98**, 084016 (2018), arXiv:1808.03619 [gr-qc].
- [110] C. Messick, K. Blackburn, P. Brady, P. Brockill, K. Cannon, R. Cariou, S. Caudill, S. J. Chamberlin, J. D. E. Creighton, R. Everett, C. Hanna, D. Keppel, R. N. Lang, T. G. F. Li, D. Meacher, A. Nielsen, C. Pankow, S. Privitera, H. Qi, S. Sachdev, L. Sadeghian, L. Singer, E. G. Thomas, L. Wade, M. Wade, A. Weinstein, and K. Wiesner, Analysis Framework for the Prompt Discovery of Compact Binary Mergers in Gravitational-wave Data, Phys. Rev. D **95**, 042001 (2017), arXiv:1604.04324 [astro-ph.IM].
- [111] S. Klimenko *et al.*, Method for detection and reconstruction of gravitational wave transients with networks of

- advanced detectors, *Phys. Rev. D* **93**, 042004 (2016), arXiv:1511.05999 [gr-qc].
- [112] T. Dal Canton, A. H. Nitz, B. Gadre, G. S. Davies, V. Villa-Ortega, T. Dent, I. Harry, and L. Xiao, Re-altime search for compact binary mergers in Advanced LIGO and Virgo’s third observing run using PyCBC Live (2020), arXiv:2008.07494 [astro-ph.HE].
- [113] T. Adams, D. Buskulic, V. Germain, G. M. Guidi, F. Marion, M. Montani, B. Mours, F. Piergiovanni, and G. Wang, Low-latency analysis pipeline for compact binary coalescences in the advanced gravitational wave detector era, *Class. Quantum Grav.* **33**, 175012 (2016), arXiv:1512.02864 [gr-qc].
- [114] Q. Chu, *Low-latency detection and localization of gravitational waves from compact binary coalescences*, Ph.D. thesis, The University of Western Australia (2017).
- [115] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Low-latency Gravitational-wave Alerts for Multimessenger Astronomy during the Second Advanced LIGO and Virgo Observing Run, *Astrophys. J.* **875**, 161 (2019), arXiv:1901.03310 [astro-ph.HE].
- [116] B. J. Owen and B. S. Sathyaprakash, Matched filtering of gravitational waves from inspiraling compact binaries: Computational cost and template placement, *Phys. Rev. D* **60**, 022002 (1999), arXiv:gr-qc/9808076 [gr-qc].
- [117] S. Klimenko and G. Mitselmakher, A wavelet method for detection of gravitational wave bursts, *8th Gravitational Wave Data Analysis Workshop (GWDW 2003)* Milwaukee, Wisconsin, December 17-20, 2003, *Class. Quantum Grav.* **21**, S1819 (2004).
- [118] S. Klimenko, S. Mohanty, M. Rakhmanov, and G. Mitselmakher, Constraint likelihood analysis for a network of gravitational wave detectors, *Phys. Rev. D* **72**, 122002 (2005), arXiv:gr-qc/0508068.
- [119] S. Klimenko, S. Mohanty, M. Rakhmanov, and G. Mitselmakher, Constraint likelihood method: Generalization for colored noise, *J. Phys. Conf. Ser.* **32**, 12 (2006).
- [120] S. Klimenko, G. Vedovato, M. Drago, G. Mazzolo, G. Mitselmakher, C. Pankow, G. Prodi, V. Re, F. Salemi, and I. Yakushin, Localization of gravitational wave sources with networks of advanced detectors, *Phys. Rev. D* **83**, 102001 (2011), arXiv:1101.5408 [astro-ph.IM].
- [121] S. Sachdev *et al.*, The GstLAL Search Analysis Methods for Compact Binary Mergers in Advanced LIGO’s Second and Advanced Virgo’s First Observing Runs (2019), arXiv:1901.08580 [gr-qc].
- [122] C. Hanna, S. Caudill, C. Messick, A. Reza, S. Sachdev, L. Tsukada, K. Cannon, K. Blackburn, J. D. E. Creighton, H. Fong, P. Godwin, S. Kapadia, T. G. F. Li, R. Magee, D. Meacher, D. Mukherjee, A. Pace, S. Privitera, R. K. L. Lo, and L. Wade, Fast evaluation of multi-detector consistency for real-time gravitational wave searches, *Phys. Rev. D* **101**, 022003 (2020), arXiv:1901.02227 [gr-qc].
- [123] B. Allen, χ^2 time-frequency discriminator for gravitational wave detection, *Phys. Rev. D* **71**, 062001 (2005), arXiv:gr-qc/0405045 [gr-qc].
- [124] T. Dal Canton *et al.*, Implementing a search for aligned-spin neutron star-black hole systems with advanced ground based gravitational wave detectors, *Phys. Rev. D* **90**, 082004 (2014), arXiv:1405.6731 [gr-qc].
- [125] S. A. Usman *et al.*, The PyCBC search for gravitational waves from compact binary coalescence, *Class. Quantum Grav.* **33**, 215004 (2016), arXiv:1508.02357 [gr-qc].
- [126] A. H. Nitz, T. Dent, T. Dal Canton, S. Fairhurst, and D. A. Brown, Detecting binary compact-object mergers with gravitational waves: Understanding and Improving the sensitivity of the PyCBC search, *Astrophys. J.* **849**, 118 (2017), arXiv:1705.01513 [gr-qc].
- [127] F. Aubin *et al.*, The MBTA Pipeline for Detecting Compact Binary Coalescences in the Third LIGO-Virgo Observing Run (2020), arXiv:2012.11512 [gr-qc].
- [128] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), All-Sky Search for Short Gravitational-Wave Bursts in the Second Advanced LIGO and Advanced Virgo Run, *Phys. Rev. D* **100**, 024017 (2019), arXiv:1905.03457 [gr-qc].
- [129] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Observing gravitational-wave transient GW150914 with minimal assumptions, *Phys. Rev. D* **93**, 122004 (2016), [Addendum: *Phys. Rev. D* **94**, 069903 (2016)], arXiv:1602.03843 [gr-qc].
- [130] V. Necula, S. Klimenko, and G. Mitselmakher, Transient analysis with fast Wilson-Daubchies time-frequency transform, *J. Phys. Conf. Ser.* **363**, 012032 (2012).
- [131] J. Aasi *et al.* (Virgo Collaboration), The characterization of Virgo data and its impact on gravitational-wave searches, *Class. Quantum Grav.* **29**, 155002 (2012), arXiv:1203.5613 [gr-qc].
- [132] V. Tiwari, S. Klimenko, V. Necula, and G. Mitselmakher, Reconstruction of chirp mass in searches for gravitational wave transients, *Class. Quantum Grav.* **33**, 01LT01 (2016), arXiv:1510.02426 [astro-ph.IM].
- [133] M. Szczepanczyk *et al.*, Observing an intermediate mass black hole GW190521 with minimal assumptions (2020), arXiv:2009.11336 [astro-ph.HE].
- [134] M. Was, M.-A. Bizouard, V. Brisson, F. Cavalier, M. Davier, P. Hello, N. Leroy, F. Robinet, and M. Vavoulidis, On the background estimation by time slides in a network of gravitational wave detectors, *Class. Quantum Grav.* **27**, 015005 (2010), arXiv:0906.2120 [gr-qc].
- [135] J. Calderón Bustillo, F. Salemi, T. Dal Canton, and K. P. Jani, Sensitivity of gravitational wave searches to the full signal of intermediate-mass black hole binaries during the first observing run of Advanced LIGO, *Phys. Rev. D* **97**, 024016 (2018), arXiv:1711.02009 [gr-qc].
- [136] B. Abbott *et al.* (LIGO Scientific, Virgo), Search for Eccentric Binary Black Hole Mergers with Advanced LIGO and Advanced Virgo during their First and Second Observing Runs, *Astrophys. J.* **883**, 149 (2019), arXiv:1907.09384 [astro-ph.HE].
- [137] A. Nitz, I. Harry, D. Brown, C. M. Biwer, J. Willis, T. Dal Canton, C. Capano, L. Pekowsky, T. Dent, A. R. Williamson, M. Cabero, S. De, G. Davies, D. Macleod, B. Machenschalk, P. Kumar, S. Reyes, T. Massinger, F. Pannarale, D. Finstad, M. Tápai, S. Fairhurst, S. Khan, L. Singer, A. Nielsen, S. Kapadia, S. Kumar, I. Dorrrington, H. Gabbard, and B. U. V. Gadre, *gwastro/pycbc: Pycbc release v1.15.0* (2019).
- [138] L. Blanchet, T. Damour, B. R. Iyer, C. M. Will, and A. G. Wiseman, Gravitational radiation damping of compact binary systems to second postNewtonian order, *Phys. Rev. Lett.* **74**, 3515 (1995), arXiv:gr-qc/9501027

- [gr-qc].
- [139] P. Ajith *et al.*, Inspiral-merger-ringdown waveforms for black-hole binaries with non-precessing spins, *Phys. Rev. Lett.* **106**, 241101 (2011), arXiv:0909.2867 [gr-qc].
- [140] P. C. Peters, Gravitational Radiation and the Motion of Two Point Masses, *Phys. Rev.* **136**, B1224 (1964).
- [141] A. Krolak and B. F. Schutz, Coalescing binaries — Probe of the universe, *Gen. Rel. Grav.* **19**, 1163 (1987).
- [142] C. Cutler and E. E. Flanagan, Gravitational waves from merging compact binaries: How accurately can one extract the binary's parameters from the inspiral wave form?, *Phys. Rev. D* **49**, 2658 (1994), arXiv:gr-qc/9402014 [gr-qc].
- [143] S. Privitera, S. R. P. Mohapatra, P. Ajith, K. Cannon, N. Fotopoulos, M. A. Frei, C. Hanna, A. J. Weinstein, and J. T. Whelan, Improving the sensitivity of a search for coalescing binary black holes with nonprecessing spins in gravitational wave data, *Phys. Rev. D* **89**, 024003 (2014), arXiv:1310.5633 [gr-qc].
- [144] I. W. Harry, B. Allen, and B. S. Sathyaprakash, A Stochastic template placement algorithm for gravitational wave data analysis, *Phys. Rev. D* **80**, 104014 (2009), arXiv:0908.2090 [gr-qc].
- [145] D. Mukherjee *et al.*, The GstLAL template bank for spinning compact binary mergers in the second observation run of Advanced LIGO and Virgo (2018), arXiv:1812.05121 [astro-ph.IM].
- [146] B. S. Sathyaprakash and S. V. Dhurandhar, Choice of filters for the detection of gravitational waves from coalescing binaries, *Phys. Rev. D* **44**, 3819 (1991).
- [147] E. Poisson, Gravitational waves from inspiraling compact binaries: The Quadrupole moment term, *Phys. Rev. D* **57**, 5287 (1998), arXiv:gr-qc/9709032 [gr-qc].
- [148] T. Damour, P. Jaranowski, and G. Schaefer, Dimensional regularization of the gravitational interaction of point masses, *Phys. Lett. B* **513**, 147 (2001), arXiv:gr-qc/0105038.
- [149] B. Mikóczki, M. Vasuth, and L. A. Gergely, Self-interaction spin effects in inspiralling compact binaries, *Phys. Rev. D* **71**, 124043 (2005), arXiv:astro-ph/0504538.
- [150] L. Blanchet, T. Damour, G. Esposito-Farese, and B. R. Iyer, Dimensional regularization of the third post-Newtonian gravitational wave generation from two point masses, *Phys. Rev. D* **71**, 124004 (2005), arXiv:gr-qc/0503044 [gr-qc].
- [151] K. G. Arun, A. Buonanno, G. Faye, and E. Ochsner, Higher-order spin effects in the amplitude and phase of gravitational waveforms emitted by inspiraling compact binaries: Ready-to-use gravitational waveforms, *Phys. Rev. D* **79**, 104023 (2009), [Erratum: *Phys. Rev. D* **84**, 049901 (2011)], arXiv:0810.5336 [gr-qc].
- [152] A. Buonanno, B. R. Iyer, E. Ochsner, Y. Pan, and B. S. Sathyaprakash, Comparison of post-Newtonian templates for compact binary inspiral signals in gravitational-wave detectors, *Phys. Rev. D* **80**, 084043 (2009), arXiv:0907.0700 [gr-qc].
- [153] A. Bohé, S. Marsat, and L. Blanchet, Next-to-next-to-leading order spin-orbit effects in the gravitational wave flux and orbital phasing of compact binaries, *Class. Quantum Grav.* **30**, 135009 (2013), arXiv:1303.7412 [gr-qc].
- [154] A. Bohé, G. Faye, S. Marsat, and E. K. Porter, Quadratic-in-spin effects in the orbital dynamics and gravitational-wave energy flux of compact binaries at the 3PN order, *Class. Quantum Grav.* **32**, 195010 (2015), arXiv:1501.01529 [gr-qc].
- [155] C. K. Mishra, A. Kela, K. G. Arun, and G. Faye, Ready-to-use post-Newtonian gravitational waveforms for binary black holes with nonprecessing spins: An update, *Phys. Rev. D* **93**, 084054 (2016), arXiv:1601.05588 [gr-qc].
- [156] A. Bohé, L. Shao, A. Taracchini, A. Buonanno, S. Babak, I. W. Harry, I. Hinder, S. Ossokine, M. Pürrer, V. Raymond, T. Chu, H. Fong, P. Kumar, H. P. Pfeiffer, M. Boyle, D. A. Hemberger, L. E. Kidder, G. Lovelace, M. A. Scheel, and B. Szilágyi, Improved effective-one-body model of spinning, nonprecessing binary black holes for the era of gravitational-wave astrophysics with advanced detectors, *Phys. Rev. D* **95**, 044028 (2017), arXiv:1611.03703 [gr-qc].
- [157] T. Dal Canton and I. W. Harry, Designing a template bank to observe compact binary coalescences in Advanced LIGO's second observing run (2017), arXiv:1705.01845 [gr-qc].
- [158] S. Roy, A. S. Sengupta, and N. Thakor, Hybrid geometric-random template-placement algorithm for gravitational wave searches from compact binary coalescences, *Phys. Rev. D* **95**, 104045 (2017), arXiv:1702.06771 [gr-qc].
- [159] S. Roy, A. S. Sengupta, and P. Ajith, Effectual template banks for upcoming compact binary searches in Advanced-LIGO and Virgo data, *Phys. Rev. D* **99**, 024048 (2019), arXiv:1711.08743 [gr-qc].
- [160] K. Cannon, C. Hanna, and J. Peoples, Likelihood-Ratio Ranking Statistic for Compact Binary Coalescence Candidates with Rate Estimation (2015), arXiv:1504.04632 [astro-ph.IM].
- [161] K. Cannon, C. Hanna, and D. Keppel, Method to estimate the significance of coincident gravitational-wave observations from compact binary coalescence, *Phys. Rev. D* **88**, 024025 (2013), arXiv:1209.0718 [gr-qc].
- [162] H. K. Y. Fong, *From simulations to signals: Analyzing gravitational waves from compact binary coalescences*, Ph.D. thesis, Toronto U. (2018).
- [163] T. Dent and J. Veitch, Optimizing gravitational-wave searches for a population of coalescing binaries: Intrinsic parameters, *Phys. Rev. D* **89**, 062002 (2014), arXiv:1311.7174 [gr-qc].
- [164] S. Babak, R. Biswas, P. R. Brady, D. A. Brown, K. Cannon, C. D. Capano, J. H. Clayton, T. Cokelaer, J. D. E. Creighton, T. Dent, A. Dietz, S. Fairhurst, N. Fotopoulos, G. González, C. Hanna, I. W. Harry, G. Jones, D. Keppel, D. J. A. McKechnie, L. Pekowsky, S. Privitera, C. Robinson, A. C. Rodriguez, B. S. Sathyaprakash, A. S. Sengupta, M. Vallisneri, R. Vaulin, and A. J. Weinstein, Searching for gravitational waves from binary coalescence, *Phys. Rev. D* **87**, 024033 (2013), arXiv:1208.3491 [gr-qc].
- [165] G. S. Davies, T. Dent, M. Tápai, I. Harry, C. McIsaac, and A. H. Nitz, Extending the PyCBC search for gravitational waves from compact binary mergers to a global network, *Phys. Rev. D* **102**, 022004 (2020), arXiv:2002.08291 [astro-ph.HE].
- [166] B. Zackay, T. Venumadhav, J. Roulet, L. Dai, and M. Zaldarriaga, Detecting Gravitational Waves in Data with Non-Gaussian Noise (2019), arXiv:1908.05644 [astro-ph.IM].

- [167] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), The Rate of Binary Black Hole Mergers Inferred from Advanced LIGO Observations Surrounding GW150914, *Astrophys. J.* **833**, L1 (2016), arXiv:1602.03842 [astro-ph.HE].
- [168] LIGO Scientific Collaboration and Virgo Collaboration, **GWTC-2 Data Release: Sensitivity of Matched Filter Searches to Binary Black Hole Merger Populations** (2020).
- [169] W. M. Farr, J. R. Gair, I. Mandel, and C. Cutler, Counting And Confusion: Bayesian Rate Estimation With Multiple Populations, *Phys. Rev. D* **91**, 023005 (2015), arXiv:1302.5341 [astro-ph.IM].
- [170] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Supplement: The Rate of Binary Black Hole Mergers Inferred from Advanced LIGO Observations Surrounding GW150914, *Astrophys. J. Suppl.* **227**, 14 (2016), arXiv:1606.03939 [astro-ph.HE].
- [171] LIGO Scientific Collaboration and Virgo Collaboration, **GCN 24168** (2019).
- [172] LIGO Scientific Collaboration and Virgo Collaboration, **GCN 24237** (2019).
- [173] J. Creighton, *Certain Identities in FGMC*, Tech. Rep. T1700029-v2 (LIGO DCC, 2017).
- [174] S. J. Kapadia *et al.*, A self-consistent method to estimate the rate of compact binary coalescences with a Poisson mixture model, *Class. Quantum Grav.* **37**, 045007 (2020), arXiv:1903.06881 [astro-ph.HE].
- [175] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Properties of the Binary Black Hole Merger GW150914, *Phys. Rev. Lett.* **116**, 241102 (2016), arXiv:1602.03840 [gr-qc].
- [176] C. P. Berry *et al.*, Parameter estimation for binary neutron-star coalescences with realistic noise during the Advanced LIGO era, *Astrophys. J.* **804**, 114 (2015), arXiv:1411.6934 [astro-ph.HE].
- [177] J. Veitch, V. Raymond, B. Farr, W. Farr, P. Graff, S. Vitale, B. Aylott, K. Blackburn, N. Christensen, M. Coughlin, W. Del Pozzo, F. Feroz, J. Gair, C.-J. Haster, V. Kalogera, T. Littenberg, I. Mandel, R. O’Shaughnessy, M. Pitkin, C. Rodriguez, C. Röver, T. Sidery, R. Smith, M. Van Der Sluys, A. Vecchio, W. Vousden, and L. Wade, Parameter estimation for compact binaries with ground-based gravitational-wave observations using the lalinference software library, *Phys. Rev. D* **91**, 042003 (2015), arXiv:1409.7215 [gr-qc].
- [178] L. S. Finn, Detection, measurement and gravitational radiation, *Phys. Rev. D* **46**, 5236 (1992), arXiv:gr-qc/9209010 [gr-qc].
- [179] T. B. Littenberg and N. J. Cornish, Bayesian inference for spectral estimation of gravitational wave detector noise, *Phys. Rev. D* **91**, 084034 (2015), arXiv:1410.3852 [gr-qc].
- [180] K. Chatziioannou, C.-J. Haster, T. B. Littenberg, W. M. Farr, S. Ghonge, M. Millhouse, J. A. Clark, and N. Cornish, Noise spectral estimation methods and their impact on gravitational wave measurement of compact binary mergers, *Phys. Rev. D* **100**, 104004 (2019), arXiv:1907.06540 [gr-qc].
- [181] F. Hofmann, E. Barausse, and L. Rezzolla, The final spin from binary black holes in quasi-circular orbits, *Astrophys. J. Lett.* **825**, L19 (2016), arXiv:1605.01938 [gr-qc].
- [182] X. Jiménez-Forteza, D. Keitel, S. Husa, M. Hannam, S. Khan, and M. Pürrer, Hierarchical data-driven approach to fitting numerical relativity data for non-precessing binary black holes with an application to final spin and radiated energy, *Phys. Rev. D* **95**, 064024 (2017), arXiv:1611.00332 [gr-qc].
- [183] J. Healy and C. O. Lousto, Remnant of binary black-hole mergers: New simulations and peak luminosity studies, *Phys. Rev. D* **95**, 024037 (2017), arXiv:1610.09713 [gr-qc].
- [184] N. K. Johnson-McDaniel, A. Gupta, P. Ajith, D. Keitel, O. Birnholtz, F. Ohme, and S. Husa, *Determining the final spin of a binary black hole system including in-plane spins: Method and checks of accuracy*, Tech. Rep. T1600168 (LSC, 2016).
- [185] D. Keitel *et al.*, The most powerful astrophysical events: Gravitational-wave peak luminosity of binary black holes as predicted by numerical relativity, *Phys. Rev. D* **96**, 024006 (2017), arXiv:1612.09566 [gr-qc].
- [186] K. Yagi and N. Yunes, Approximate Universal Relations for Neutron Stars and Quark Stars, *Phys. Rep.* **681**, 1 (2017), arXiv:1608.02582 [gr-qc].
- [187] M. Favata, Systematic parameter errors in inspiraling neutron star binaries, *Phys. Rev. Lett.* **112**, 101101 (2014), arXiv:1310.8288 [gr-qc].
- [188] L. Wade, J. D. E. Creighton, E. Ochsner, B. D. Lackey, B. F. Farr, T. B. Littenberg, and V. Raymond, Systematic and statistical errors in a bayesian approach to the estimation of the neutron-star equation of state using advanced gravitational wave detectors, *Phys. Rev. D* **89**, 103012 (2014), arXiv:1402.5156 [gr-qc].
- [189] T. Binnington and E. Poisson, Relativistic theory of tidal Love numbers, *Phys. Rev. D* **80**, 084018 (2009), arXiv:0906.1366 [gr-qc].
- [190] T. Damour and A. Nagar, Relativistic tidal properties of neutron stars, *Phys. Rev. D* **80**, 084035 (2009), arXiv:0906.0096 [gr-qc].
- [191] P. Landry and E. Poisson, Tidal deformation of a slowly rotating material body. External metric, *Phys. Rev. D* **91**, 104018 (2015), arXiv:1503.07366 [gr-qc].
- [192] P. Pani, L. Gualtieri, A. Maselli, and V. Ferrari, Tidal deformations of a spinning compact object, *Phys. Rev. D* **92**, 024010 (2015), arXiv:1503.07365 [gr-qc].
- [193] S. Husa, S. Khan, M. Hannam, M. Pürrer, F. Ohme, X. Jiménez Forteza, and A. Bohé, Frequency-domain gravitational waves from nonprecessing black-hole binaries. I. New numerical waveforms and anatomy of the signal, *Phys. Rev. D* **93**, 044006 (2016), arXiv:1508.07250 [gr-qc].
- [194] S. Khan, S. Husa, M. Hannam, F. Ohme, M. Pürrer, X. Jiménez Forteza, and A. Bohé, Frequency-domain gravitational waves from nonprecessing black-hole binaries. II. A phenomenological model for the advanced detector era, *Phys. Rev. D* **93**, 044007 (2016), arXiv:1508.07253 [gr-qc].
- [195] L. London, S. Khan, E. Fauchon-Jones, C. García, M. Hannam, S. Husa, X. Jiménez-Forteza, C. Kalaghatgi, F. Ohme, and F. Pannarale, First higher-multipole model of gravitational waves from spinning and coalescing black-hole binaries, *Phys. Rev. Lett.* **120**, 161102 (2018).
- [196] R. Cotesta, A. Buonanno, A. Bohé, A. Taracchini, I. Hinder, and S. Ossokine, Enriching the Symphony of Gravitational Waves from Binary Black Holes by Tun-

- ing Higher Harmonics, *Phys. Rev. D* **98**, 084028 (2018), arXiv:1803.10701 [gr-qc].
- [197] R. Cotesta, S. Marsat, and M. Pürller, Frequency domain reduced order model of aligned-spin effective-one-body waveforms with higher-order modes, *Phys. Rev. D* **101**, 124040 (2020), arXiv:2003.12079 [gr-qc].
- [198] S. Ossokine *et al.*, Multipolar Effective-One-Body Waveforms for Precessing Binary Black Holes: Construction and Validation, *Phys. Rev. D* **102**, 044055 (2020), arXiv:2004.09442 [gr-qc].
- [199] S. Babak, A. Taracchini, and A. Buonanno, Validating the effective-one-body model of spinning, precessing binary black holes against numerical relativity, *Phys. Rev. D* **95**, 024010 (2017), arXiv:1607.05661 [gr-qc].
- [200] Y. Pan, A. Buonanno, A. Taracchini, L. E. Kidder, A. H. Mroué, H. P. Pfeiffer, M. A. Scheel, and B. Szilágyi, Inspiral-merger-ringdown waveforms of spinning, precessing black-hole binaries in the effective-one-body formalism, *Phys. Rev. D* **89**, 084006 (2014), arXiv:1307.6232 [gr-qc].
- [201] M. Hannam, P. Schmidt, A. Bohé, L. Haegel, S. Husa, F. Ohme, G. Pratten, and M. Pürller, Simple Model of Complete Precessing Black-Hole-Binary Gravitational Waveforms, *Phys. Rev. Lett.* **113**, 151101 (2014), arXiv:1308.3271 [gr-qc].
- [202] S. Khan, K. Chatzioannou, M. Hannam, and F. Ohme, Phenomenological model for the gravitational-wave signal from precessing binary black holes with two-spin effects, *Phys. Rev. D* **100**, 024059 (2019).
- [203] S. Khan, F. Ohme, K. Chatzioannou, and M. Hannam, Including higher order multipoles in gravitational-wave models for precessing binary black holes, *Phys. Rev. D* **101**, 024056 (2020), arXiv:1911.06050 [gr-qc].
- [204] V. Varma, S. E. Field, M. A. Scheel, J. Blackman, D. Gerosa, L. C. Stein, L. E. Kidder, and H. P. Pfeiffer, Surrogate models for precessing binary black hole simulations with unequal masses, *Phys. Rev. Research.* **1**, 033015 (2019), arXiv:1905.09300 [gr-qc].
- [205] T. Dietrich, S. Khan, R. Dudi, S. J. Kapadia, P. Kumar, A. Nagar, F. Ohme, F. Pannarale, A. Samajdar, S. Bernuzzi, G. Carullo, W. Del Pozzo, M. Haney, C. Markakis, M. Pürller, G. Riemenschneider, Y. E. Setyawati, K. W. Tsang, and C. Van Den Broeck, Matter imprints in waveform models for neutron star binaries: Tidal and self-spin effects, *Phys. Rev. D* **99**, 024029 (2019), arXiv:1804.02235 [gr-qc].
- [206] T. Dietrich, S. Bernuzzi, and W. Tichy, Closed-form tidal approximants for binary neutron star gravitational waveforms constructed from high-resolution numerical relativity simulations, *Phys. Rev. D* **96**, 121501(R) (2017), arXiv:1706.02969 [gr-qc].
- [207] S. Bernuzzi, A. Nagar, T. Dietrich, and T. Damour, Modeling the Dynamics of Tidally Interacting Binary Neutron Stars up to the Merger, *Phys. Rev. Lett.* **114**, 161103 (2015), arXiv:1412.4553 [gr-qc].
- [208] B. D. Lackey, M. Pürller, A. Taracchini, and S. Marsat, Surrogate model for an aligned-spin effective one body waveform model of binary neutron star inspirals using Gaussian process regression, *Phys. Rev. D* **100**, 024002 (2019), arXiv:1812.08643 [gr-qc].
- [209] T. Hinderer *et al.*, Effects of neutron-star dynamic tides on gravitational waveforms within the effective-one-body approach, *Phys. Rev. Lett.* **116**, 181101 (2016), arXiv:1602.00599 [gr-qc].
- [210] J. Steinhoff, T. Hinderer, A. Buonanno, and A. Taracchini, Dynamical Tides in General Relativity: Effective Action and Effective-One-Body Hamiltonian, *Phys. Rev. D* **94**, 104028 (2016), arXiv:1608.01907 [gr-qc].
- [211] A. Matas *et al.*, Aligned-spin neutron-star-black-hole waveform model based on the effective-one-body approach and numerical-relativity simulations, *Phys. Rev. D* **102**, 043023 (2020), arXiv:2004.10001 [gr-qc].
- [212] J. E. Thompson, E. Fauchon-Jones, S. Khan, E. Nitoglia, F. Pannarale, T. Dietrich, and M. Hannam, Modeling the gravitational wave signature of neutron star black hole coalescences: PhenomNSBH, *Phys. Rev. D* **101**, 124059 (2020), arXiv:2002.08383 [gr-qc].
- [213] P. Schmidt, F. Ohme, and M. Hannam, Towards models of gravitational waveforms from generic binaries II: Modelling precession effects with a single effective precession parameter, *Phys. Rev. D* **91**, 024043 (2015), arXiv:1408.1810 [gr-qc].
- [214] A. Buonanno and T. Damour, Effective one-body approach to general relativistic two-body dynamics, *Phys. Rev. D* **59**, 084006 (1999), arXiv:gr-qc/9811091.
- [215] A. Buonanno and T. Damour, Transition from inspiral to plunge in binary black hole coalescences, *Phys. Rev. D* **62**, 064015 (2000), arXiv:gr-qc/0001013.
- [216] P. Schmidt, M. Hannam, S. Husa, and P. Ajith, Tracking the precession of compact binaries from their gravitational-wave signal, *Phys. Rev. D* **84**, 024046 (2011), arXiv:1012.2879 [gr-qc].
- [217] M. Boyle, R. Owen, and H. P. Pfeiffer, A geometric approach to the precession of compact binaries, *Phys. Rev. D* **84**, 124011 (2011), arXiv:1110.2965 [gr-qc].
- [218] R. O’Shaughnessy, B. Vaishnav, J. Healy, Z. Meeks, and D. Shoemaker, Efficient asymptotic frame selection for binary black hole spacetimes using asymptotic radiation, *Phys. Rev. D* **84**, 124002 (2011), arXiv:1109.5224 [gr-qc].
- [219] E. Ochsner and R. O’Shaughnessy, Asymptotic frame selection for binary black hole spacetimes II: Post-Newtonian limit, *Phys. Rev. D* **86**, 104037 (2012), arXiv:1205.2287 [gr-qc].
- [220] P. Schmidt, M. Hannam, and S. Husa, Towards models of gravitational waveforms from generic binaries: A simple approximate mapping between precessing and non-precessing inspiral signals, *Phys. Rev. D* **86**, 104063 (2012), arXiv:1207.3088 [gr-qc].
- [221] T. Damour, A. Nagar, and L. Villain, Measurability of the tidal polarizability of neutron stars in late-inspiral gravitational-wave signals, *Phys. Rev. D* **85**, 123007 (2012), arXiv:1203.4352 [gr-qc].
- [222] A. Maselli, V. Cardoso, V. Ferrari, L. Gualtieri, and P. Pani, Equation-of-state-independent relations in neutron stars, *Phys. Rev. D* **88**, 023007 (2013), arXiv:1304.2052 [gr-qc].
- [223] L. Santamaria *et al.*, Matching post-Newtonian and numerical relativity waveforms: systematic errors and a new phenomenological model for non-precessing black hole binaries, *Phys. Rev. D* **82**, 064016 (2010), arXiv:1005.3306 [gr-qc].
- [224] T. Dietrich, A. Samajdar, S. Khan, N. K. Johnson-McDaniel, R. Dudi, and W. Tichy, Improving the NR-Tidal model for binary neutron star systems, *Phys. Rev. D* **100**, 044003 (2019), arXiv:1905.06011 [gr-qc].
- [225] G. Ashton and S. Khan, Multiwaveform inference of gravitational waves, *Phys. Rev. D* **101**, 064037 (2020),

- arXiv:1910.09138 [gr-qc].
- [226] J. Skilling, Nested sampling for general bayesian computation, *Bayesian Analysis* **1**, 833 (2006).
- [227] C. Pankow, P. Brady, E. Ochsner, and R. O’Shaughnessy, Novel scheme for rapid parallel parameter estimation of gravitational waves from compact binary coalescences, *Phys. Rev. D* **92**, 023002 (2015), arXiv:1502.04370 [gr-qc].
- [228] J. Lange, R. O’Shaughnessy, M. Boyle, J. Calderón Bustillo, M. Campanelli, T. Chu, J. A. Clark, N. Demos, H. Fong, J. Healy, D. A. Hemberger, I. Hinder, K. Jani, B. Khamesra, L. E. Kidder, P. Kumar, P. Laguna, C. O. Lousto, G. Lovelace, S. Ossokine, H. Pfeiffer, M. A. Scheel, D. M. Shoemaker, B. Szilagyi, S. Teukolsky, and Y. Zlochower, Parameter estimation method that directly compares gravitational wave observations to numerical relativity, *Phys. Rev. D* **96**, 104041 (2017), arXiv:1705.09833 [gr-qc].
- [229] D. Wysocki, R. O’Shaughnessy, J. Lange, and Y.-L. L. Fang, Accelerating parameter inference with graphics processing units, *Phys. Rev. D* **99**, 084026 (2019), arXiv:1902.04934 [astro-ph.IM].
- [230] R. Smith, G. Ashton, A. Vajpeyi, and C. Talbot, Massively parallel Bayesian inference for transient gravitational-wave astronomy (2019), arXiv:1909.11873 [gr-qc].
- [231] G. Ashton *et al.*, BILBY: A user-friendly Bayesian inference library for gravitational-wave astronomy, *Astrophys. J. Suppl.* **241**, 27 (2019), arXiv:1811.02042 [astro-ph.IM].
- [232] I. Romero-Shaw *et al.*, Bayesian inference for compact binary coalescences with BILBY: Validation and application to the first LIGO–Virgo gravitational-wave transient catalogue (2020), arXiv:2006.00714 [astro-ph.IM].
- [233] J. S. Speagle, DYNESTY: a dynamic nested sampling package for estimating Bayesian posteriors and evidences, *Mon. Not. Roy. Astron. Soc.* **493**, 3132 (2020), arXiv:1904.02180 [astro-ph.IM].
- [234] R. Abbott *et al.* (LIGO Scientific, Virgo), GW190412: Observation of a Binary-Black-Hole Coalescence with Asymmetric Masses, *Phys. Rev. D* **102**, 043015 (2020), arXiv:2004.08342 [astro-ph.HE].
- [235] C. Hoy and V. Raymond, PEsummary: the code agnostic Parameter Estimation Summary page builder (2020), arXiv:2006.06639 [astro-ph.IM].
- [236] P. Ade *et al.* (Planck), Planck 2015 results. XIII. Cosmological parameters, *Astron. Astrophys.* **594**, A13 (2016), arXiv:1502.01589 [astro-ph.CO].
- [237] LIGO Scientific Collaboration and Virgo Collaboration, GCN **24442** (2019).
- [238] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25087** (2019).
- [239] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25606** (2019).
- [240] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25695** (2019).
- [241] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25707** (2019).
- [242] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25814** (2019).
- [243] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25876** (2019).
- [244] LIGO Scientific Collaboration and Virgo Collaboration, GCN **24045** (2019).
- [245] LIGO Scientific Collaboration and Virgo Collaboration, GCN **G298048** (2017).
- [246] LIGO Scientific Collaboration and Virgo Collaboration, GCN **24462** (2019).
- [247] LIGO Scientific Collaboration and Virgo Collaboration, GCN **24489** (2019).
- [248] LIGO Scientific Collaboration and Virgo Collaboration, GCN **24109** (2019).
- [249] LIGO Scientific Collaboration and Virgo Collaboration, GCN **24591** (2019).
- [250] LIGO Scientific Collaboration and Virgo Collaboration, GCN **24656** (2019).
- [251] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25301** (2019).
- [252] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25367** (2019).
- [253] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25442** (2019).
- [254] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25554** (2019).
- [255] LIGO Scientific Collaboration and Virgo Collaboration, GCN **25883** (2019).
- [256] LIGO Scientific Collaboration and Virgo Collaboration, *GWTC-2 data release* (2020).
- [257] C. D. Bailyn, R. K. Jain, P. Coppi, and J. A. Orosz, The Mass distribution of stellar black holes, *Astrophys. J.* **499**, 367 (1998), arXiv:astro-ph/9708032.
- [258] F. Ozel, D. Psaltis, R. Narayan, and J. E. McClintock, The Black Hole Mass Distribution in the Galaxy, *Astrophys. J.* **725**, 1918 (2010), arXiv:1006.2834 [astro-ph.GA].
- [259] W. M. Farr, N. Sravan, A. Cantrell, L. Kreidberg, C. D. Bailyn, I. Mandel, and V. Kalogera, The Mass Distribution of Stellar-Mass Black Holes, *Astrophys. J.* **741**, 103 (2011), arXiv:1011.1459 [astro-ph.GA].
- [260] F. Ozel, D. Psaltis, R. Narayan, and A. S. Villarreal, On the Mass Distribution and Birth Masses of Neutron Stars, *Astrophys. J.* **757**, 55 (2012), arXiv:1201.1006 [astro-ph.HE].
- [261] M. C. Miller and J. M. Miller, The Masses and Spins of Neutron Stars and Stellar-Mass Black Holes, *Phys. Rept.* **548**, 1 (2014), arXiv:1408.4145 [astro-ph.HE].
- [262] M. Heida, P. Jonker, M. Torres, and A. Chiavassa, The Mass Function of GX 339–4 from Spectroscopic Observations of Its Donor Star, *Astrophys. J.* **846**, 132 (2017), arXiv:1708.04667 [astro-ph.HE].
- [263] T. A. Thompson *et al.*, Discovery of a Candidate Black Hole - Giant Star Binary System in the Galactic Field (2018), arXiv:1806.02751 [astro-ph.HE].
- [264] J. M. Lattimer, The nuclear equation of state and neutron star masses, *Ann. Rev. Nucl. Part. Sci.* **62**, 485 (2012), arXiv:1305.3510 [nucl-th].
- [265] F. Özel and P. Freire, Masses, Radii, and the Equation of State of Neutron Stars, *Ann. Rev. Astron. Astrophys.* **54**, 401 (2016), arXiv:1603.02698 [astro-ph.HE].
- [266] J. Alsing, H. O. Silva, and E. Berti, Evidence for a maximum mass cut-off in the neutron star mass distribution and constraints on the equation of state, *Mon. Not. Roy. Astron. Soc.* **478**, 1377 (2018), arXiv:1709.07889 [astro-ph.HE].
- [267] K. Chatzioannou and W. M. Farr, Inferring the maximum and minimum mass of merging neutron stars with gravitational waves, *Phys. Rev. D* **102**, 064063 (2020),

- arXiv:2005.00482 [astro-ph.HE].
- [268] T. M. Tauris *et al.*, Formation of Double Neutron Star Systems, *Astrophys. J.* **846**, 170 (2017), arXiv:1706.09438 [astro-ph.HE].
- [269] N. Farrow, X.-J. Zhu, and E. Thrane, The mass distribution of Galactic double neutron stars, *Astrophys. J.* **876**, 18 (2019), arXiv:1902.03300 [astro-ph.HE].
- [270] M. Safarzadeh, E. Ramirez-Ruiz, and E. Berger, Does GW190425 require an alternative formation pathway than a fast-merging channel?, *Astrophys. J.* **900**, 13 (2020), arXiv:2001.04502 [astro-ph.HE].
- [271] A. Gupta, D. Gerosa, K. G. Arun, E. Berti, W. M. Farr, and B. S. Sathyaprakash, Black holes in the low mass gap: Implications for gravitational wave observations, *Phys. Rev. D* **101**, 103036 (2020), arXiv:1909.05804 [gr-qc].
- [272] I. M. Romero-Shaw, N. Farrow, S. Stevenson, E. Thrane, and X.-J. Zhu, On the origin of GW190425, *Mon. Not. Roy. Astron. Soc.* **496**, L64 (2020), arXiv:2001.06492 [astro-ph.HE].
- [273] I. Mandel, B. Mueller, J. Riley, S. E. de Mink, A. Vigna-Gomez, and D. Chattopadhyay, Binary population synthesis with probabilistic remnant mass and kick prescriptions (2020), arXiv:2007.03890 [astro-ph.HE].
- [274] J. Lin, Divergence measures based on the shannon entropy, *IEEE Transactions on Information Theory* **37**, 145 (1991).
- [275] M. Zevin, C. P. L. Berry, S. Coughlin, K. Chatzioannou, and S. Vitale, You Can't Always Get What You Want: The Impact of Prior Assumptions on Interpreting GW190412, *Astrophys. J. Lett.* **899**, L17 (2020), arXiv:2006.11293 [astro-ph.HE].
- [276] S. Fairhurst, R. Green, C. Hoy, M. Hannam, and A. Muir, Two-harmonic approximation for gravitational waveforms from precessing binaries, *Phys. Rev. D* **102**, 024055 (2020), arXiv:1908.05707 [gr-qc].
- [277] S. Fairhurst, R. Green, M. Hannam, and C. Hoy, When will we observe binary black holes precessing?, *Phys. Rev. D* **102**, 041302(R) (2020), arXiv:1908.00555 [gr-qc].
- [278] R. Green, C. Hoy, S. Fairhurst, M. Hannam, F. Panzarale, and C. Thomas, Identifying when Precession can be Measured in Gravitational Waveforms (2020), arXiv:2010.04131 [gr-qc].
- [279] G. Pratten, P. Schmidt, R. Buscicchio, and L. M. Thomas, Measuring precession in asymmetric compact binaries, *Phys. Rev. Research* **2**, 043096 (2020).
- [280] N. Christensen and R. Meyer, Markov chain Monte Carlo methods for Bayesian gravitational radiation data analysis, *Phys. Rev. D* **58**, 082001 (1998).
- [281] F. Salemi, E. Milotti, G. A. Prodi, G. Vedovato, C. Lazzaro, S. Tiwari, S. Vinciguerra, M. Drago, and S. Klimenko, Wider look at the gravitational-wave transients from GWTC-1 using an unmodeled reconstruction method, *Phys. Rev. D* **100**, 042003 (2019), arXiv:1905.09260 [gr-qc].
- [282] S. Ghonge, K. Chatzioannou, J. A. Clark, T. Littenberg, M. Millhouse, L. Cadonati, and N. Cornish, Reconstructing gravitational wave signals from binary black hole mergers with minimal assumptions, *Phys. Rev. D* **102**, 064056 (2020), arXiv:2003.09456 [gr-qc].
- [283] D. Macleod, *GWOSC Client* (2020).
- [284] T. Akutsu *et al.* (KAGRA), KAGRA: 2.5 Generation Interferometric Gravitational Wave Detector, *Nat. As-*tron. **3**, 35 (2019), arXiv:1811.08079 [gr-qc].
- [285] B. P. Abbott *et al.* (KAGRA, LIGO Scientific Collaboration, Virgo Collaboration), Prospects for Observing and Localizing Gravitational-Wave Transients with Advanced LIGO, Advanced Virgo and KAGRA (2020), arXiv:1304.0670v10 [gr-qc].
- [286] C. Pankow, M. Rizzo, K. Rao, C. P. L. Berry, and V. Kalogera, Localization of Compact Binary Sources with Second Generation Gravitational-wave Interferometer Networks (2019), arXiv:1909.12961 [astro-ph.HE].
- [287] LIGO Scientific Collaboration, *LIGO Algorithm Library* (2018).
- [288] J. D. Hunter, Matplotlib: A 2D Graphics Environment, *Comput. Sci. Eng.* **9**, 90 (2007).
- [289] M. Waskom and the seaborn development team, *mwaskom/seaborn* (2020).
- [290] D. Macleod *et al.*, *gwpy/gwpy*: 2.0.1 (2020).
- [291] C. R. Harris, K. J. Millman, S. J. van der Walt, R. Gommers, P. Virtanen, D. Cournapeau, E. Wieser, J. Taylor, S. Berg, N. J. Smith, R. Kern, M. Picus, S. Hoyer, M. H. van Kerkwijk, M. Brett, A. Haldane, J. Fernández del Río, M. Wiebe, P. Peterson, P. Gérard-Marchant, K. Sheppard, T. Reddy, W. Weckesser, H. Abbasi, C. Gohlke, and T. E. Oliphant, Array programming with NumPy, *Nature* **585**, 357–362 (2020).
- [292] P. Virtanen, R. Gommers, T. E. Oliphant, M. Haberland, T. Reddy, D. Cournapeau, E. Burovski, P. Peterson, W. Weckesser, J. Bright, S. J. van der Walt, M. Brett, J. Wilson, K. J. Millman, N. Mayorov, A. R. J. Nelson, E. Jones, R. Kern, E. Larson, C. J. Carey, I. Polat, Y. Feng, E. W. Moore, J. VanderPlas, D. Laxalde, J. Perktold, R. Cimrman, I. Henriksen, E. A. Quintero, C. R. Harris, A. M. Archibald, A. H. Ribeiro, F. Pedregosa, P. van Mulbregt, and SciPy 1.0 Contributors, SciPy 1.0: Fundamental Algorithms for Scientific Computing in Python, *Nature Methods* **17**, 261 (2020).
- [293] B. P. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Effects of waveform model systematics on the interpretation of GW150914, *Class. Quantum Grav.* **34**, 104002 (2017), arXiv:1611.07531 [gr-qc].
- [294] T. D. Abbott *et al.* (LIGO Scientific Collaboration, Virgo Collaboration), Improved analysis of GW150914 using a fully spin-precessing waveform Model, *Phys. Rev. X* **6**, 041014 (2016), arXiv:1606.01210 [gr-qc].
- [295] S. Kullback and R. A. Leibler, On information and sufficiency, *Ann. Math. Statist.* **22**, 79 (1951).
- [296] F. H. Shaik, J. Lange, S. E. Field, R. O'Shaughnessy, V. Varma, L. E. Kidder, H. P. Pfeiffer, and D. Wysocki, Impact of subdominant modes on the interpretation of gravitational-wave signals from heavy binary black hole systems, *Phys. Rev. D* **101**, 124054 (2020), arXiv:1911.02693 [gr-qc].
- [297] M. Pürrer and C.-J. Haster, Gravitational waveform accuracy requirements for future ground-based detectors, *Physical Review Research* **2**, 023151 (2020), arXiv:1912.10055 [gr-qc].
- [298] V. Varma and P. Ajith, Effects of nonquadrupole modes in the detection and parameter estimation of black hole binaries with nonprecessing spins, *Phys. Rev. D* **96**, 124024 (2017), arXiv:1612.05608 [gr-qc].
- [299] J. Calderón Bustillo, S. Husa, A. M. Sintes, and M. Pürrer, Impact of gravitational radiation higher or-

- der modes on single aligned-spin gravitational wave searches for binary black holes, *Phys. Rev. D* **93**, 084019 (2016), arXiv:1511.02060 [gr-qc].
- [300] T. B. Littenberg, J. G. Baker, A. Buonanno, and B. J. Kelly, Systematic biases in parameter estimation of binary black-hole mergers, *Phys. Rev. D* **87**, 104003 (2013), arXiv:1210.0893 [gr-qc].
- [301] J. Calderón Bustillo, P. Laguna, and D. Shoemaker, Detectability of gravitational waves from binary black holes: Impact of precession and higher modes, *Phys. Rev. D* **95**, 104038 (2017), arXiv:1612.02340 [gr-qc].
- [302] D. A. Brown, P. Kumar, and A. H. Nitz, Template banks to search for low-mass binary black holes in advanced gravitational-wave detectors, *Phys. Rev. D* **87**, 082004 (2013), arXiv:1211.6184 [gr-qc].
- [303] V. Varma, P. Ajith, S. Husa, J. C. Bustillo, M. Hannam, and M. Pürrer, Gravitational-wave observations of binary black holes: Effect of nonquadrupole modes, *Phys. Rev. D* **90**, 124004 (2014), arXiv:1409.2349 [gr-qc].
- [304] P. B. Graff, A. Buonanno, and B. S. Sathyaprakash, Missing Link: Bayesian detection and measurement of intermediate-mass black-hole binaries, *Phys. Rev. D* **92**, 022002 (2015), arXiv:1504.04766 [gr-qc].
- [305] R. O’Shaughnessy, B. Farr, E. Ochsner, H.-S. Cho, V. Raymond, C. Kim, and C.-H. Lee, Parameter estimation of gravitational waves from precessing black hole-neutron star inspirals with higher harmonics, *Phys. Rev. D* **89**, 102005 (2014), arXiv:1403.0544 [gr-qc].
- [306] S. A. Usman, J. C. Mills, and S. Fairhurst, Constraining the Inclinations of Binary Mergers from Gravitational-wave Observations, *Astrophys. J.* **877**, 82 (2019), arXiv:1809.10727 [gr-qc].
- [307] P. Kumar, J. Blackman, S. E. Field, M. Scheel, C. R. Galley, M. Boyle, L. E. Kidder, H. P. Pfeiffer, B. Szilagyi, and S. A. Teukolsky, Constraining the parameters of GW150914 and GW170104 with numerical relativity surrogates, *Phys. Rev. D* **99**, 124005 (2019), arXiv:1808.08004 [gr-qc].
- [308] C. Mills and S. Fairhurst, Measuring gravitational-wave higher-order modes (2020), arXiv:2007.04313 [gr-qc].
- [309] K. Chatzioannou, A. Klein, N. Yunes, and N. Cornish, Constructing Gravitational Waves from Generic Spin-Precessing Compact Binary Inspirals, *Phys. Rev. D* **95**, 104004 (2017), arXiv:1703.03967 [gr-qc].
- [310] B. Bécsy, P. Raffai, N. J. Cornish, R. Essick, J. Kanner, E. Katsavounidis, T. B. Littenberg, M. Millhouse, and S. Vitale, Parameter estimation for gravitational-wave bursts with the BayesWave pipeline, *Astrophys. J.* **839**, 15 (2017), arXiv:1612.02003 [astro-ph.HE].
- [311] F. Pannarale, R. Macas, and P. J. Sutton, Bayesian Inference Analysis of Unmodelled Gravitational-Wave Transients, *Class. Quantum Grav.* **36**, 035011 (2019), arXiv:1807.01939 [gr-qc].
- [312] F. Mosteller and R. A. Fisher, Questions and answers, *The American Statistician* **2**, 30 (1948).