# GWTC-2.1: Deep extended catalog of compact binary coalescences observed by LIGO and Virgo during the first half of the third observing run

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The second Gravitational-Wave Transient Catalog, GWTC-2, reported on 39 compact binary coalescences observed by the Advanced LIGO and Advanced Virgo detectors between 1 April 2019 15:00 UTC and 1 October 2019 15:00 UTC. Here, we present GWTC-2.1, which reports on a deeper list of candidate events observed over the same period. We analyze the final version of the strain data over this period with improved calibration and better subtraction of excess noise, which has been publicly released. We employ three matched-filter search pipelines for candidate identification, and estimate the probability of astrophysical origin for each candidate event. While GWTC-2 used a false alarm rate threshold of 2 per year, we include in GWTC-2.1, 1201 candidates that pass a false alarm rate threshold of 2 per day. We calculate the source properties of a subset of 44 high-significance candidates that have a probability of astrophysical origin greater than 0.5. Of these candidates, 36 have been reported in GWTC-2. We also

<sup>\*</sup>Deceased, August 2020.

calculate updated source properties for all binary black hole events previously reported in GWTC-1. If the eight additional high-significance candidates presented here are astrophysical, the mass range of events that are unambiguously identified as binary black holes (both objects  $\geq 3M_{\odot}$ ) is increased compared to GWTC-2, with total masses from  $\sim 14M_{\odot}$  for GW190924\_021846 to  $\sim 182M_{\odot}$  for GW190426\_190642. Source properties calculated using our default prior suggest that the primary components of two new candidate events (GW190403\_051519 and GW190426\_190642) fall in the mass gap predicted by pair-instability supernova theory. We also expand the population of binaries with significantly asymmetric mass ratios reported in GWTC-2 by an additional two events (the mass ratio is less than 0.65 and 0.44 at 90% probability for GW190403\_051519 and GW190917\_114630 respectively), and find that two of the eight new events have effective inspiral spins  $\chi_{\rm eff} > 0$  (at 90% credibility), while no binary is consistent with  $\chi_{\rm eff} < 0$  at the same significance. We provide updated estimates for rates of binary black hole and binary neutron star coalescence in the local Universe.

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#### I. INTRODUCTION

We are in the era of gravitational wave (GW) astronomy, started by the Advanced Laser Interferometer Gravitational-Wave Observatory (LIGO) [1] and the Advanced Virgo [2] detectors. The first observing run (O1) of the advanced detectors yielded the first detection of GWs from a binary black hole (BBH), GW150914 [3]. By the end of O1, the LIGO Scientific and Virgo Collaboration (LVC) had reported on three BBH events [4]. The second observing run (O2) of the advanced detectors saw the first direct detection of GWs from a binary neutron star (BNS), GW170817 [5]. This event was also detected in electromagnetic waves [6], expanding the field of multimessenger astronomy to include GWs. By the end of O2, the LVC had reported on a total of ten BBHs and one BNS event, described in the first Gravitational-Wave Transient Catalog, GWTC-1 [7]. The second Gravitational-Wave Transient Catalog, GWTC-2 [8], added 39 GW events from the first half of the third observing run (O3a), and included a total of 50 events. The GW data until the end of third observing run (O3) have been made available to the public by the LVC. Since the public release of the LIGO and Virgo data, groups other than the LVC have also performed analyses searching for GW signals [9-21] and reported additional candidate events in some cases.

GW events between 1 April 2019 15:00 UTC and 1 October 2019 15:00 UTC (O3a) that passed a false alarm rate (FAR) threshold of 2 per year were presented in GWTC-2. Here, we present GWTC-2.1, a deep catalog that includes 1201 candidates passing a low-significance FAR threshold of 2 per day. Although most of the candidates in this catalog are noise events, they can be used for multimessenger searches by comparing against other astronomical surveys. Temporal and spatial coincidences between candidates in distinct astrophysical channels could lead to multimessenger discoveries [22,23]. Multimessenger observations could enhance our understanding of the physical processes associated with such systems. Previous GW searches, both from the LVC [24] and independent

groups [10,13,14,24,25], including the 3-OGC analysis of public data from O1 to O3a [17], have released subthreshold candidates. It is computationally unfeasible to determine detailed source properties of the large set of subthreshold GW candidates, therefore we identify a subset of compact binary coalescence (CBC) candidates that have a probability of astrophysical origin  $p_{\text{astro}}$  [26–28] greater than 0.5, and calculate the source properties of these events. This probability  $p_{\text{astro}}$  uses both the signal rate in addition to the noise rate in order to determine the significance of events. There are 44 such candidate events, 36 of which have already been reported in GWTC-2 and their source properties have been described in detail [8]. We present the source properties with a consistent set of state-of-the-art waveform models for all of these candidates, discussing the properties of the eight new events that have a  $p_{astro}$  greater than 0.5 in detail in the body of the paper, and our results for the previously reported candidates in the Appendix. A subset of the eight additional events have been found in the LVC search of O3a data [29] for faint gravitationally lensed counterpart images [30,31], and in the independent 3-OGC [17] analysis. While the eight new events presented here have a non-negligible probability of being from noise, some of these have astrophysically interesting source properties under the default prior. Two of the new candidates presented here have a primary component mass in the pair instability gap [32–40], and one of those shows support for high spin and unequal masses. We also find a new candidate whose masses are consistent with a neutron star black hole binary (NSBH), although as in the case of GW190814 [41], we cannot rule out the possibility that the secondary component of the candidate could be a low-mass black hole.

In this work, all the analyses make use of the final version of the strain data with improved calibration and noise subtraction, which includes nonlinear subtraction around the 60 Hz frequency of the US power grid [42,43]. The data used in this work have been released to the public [44–47]. We use three matched-filter pipelines

for candidate identification: GstLAL [48–50], PyCBC [51–55], and MBTA [56]. MBTA is reporting results from an archival search for the first time. Previously, in GWTC-2, only the GstLAL matched-filter pipeline included Virgo data; now all three pipelines analyze the data from all three detectors. For inferring the source properties, we use waveform models that include effects of spin-induced precession of the binary orbit, contributions from both the dominant and subdominant spherical harmonic modes, and tidal effects as appropriate [57–66].

The paper is structured as follows. Section II describes the instruments and the data that are analyzed by the searches, including methods on calibration, data quality, and glitch mitigation. Section III describes the methods used by the search pipelines. Section IV describes the events in GWTC-2.1, comparison to GWTC-2, sensitivity of the search pipelines used, and inferred rates of BNSs and BBHs. Section V describes the methods used for estimating the source parameters of the GW candidates and results, and in Sec. VI, we discuss the astrophysically interesting events and their implications. In Sec. VII we describe the data products being released alongside this catalog and our conclusions. Finally, in the Appendix, we provide the source properties of events with  $p_{\text{astro}}$  greater than 0.5 that have previously been described in GWTC-1 and GWTC-2. Companion results from the second half of the third observing run (O3b) are presented in the third Gravitational-Wave Transient Catalog, GWTC-3 [67].

#### II. INSTRUMENTS AND DATA

The Advanced LIGO [1] and Advanced Virgo [2] instruments are kilometer-scale laser interferometers. The two LIGO detectors are located in Hanford, Washington and Livingston, Louisiana in the United States, and the Virgo detector near Pisa in Italy. The advanced generation of interferometers began operations in 2015, and observing periods have alternated with commissioning periods since then [68]. In the time between O2 and the O3, all three detectors underwent significant upgrades that substantially increased their sensitivity [8,69].

Major instrumentation upgrades on the LIGO detectors included; replacement of main lasers to increase beam stability, replacement of test masses to lower scattering and absorption losses, installation of acoustic mode dampers to mitigate parametric instabilities [70], installation of a squeezed vacuum source to reduce quantum noise [71], addressing issues with scattered light [72], and implementation of improved feedback control systems for the instruments. Compared to the O2 run, the Hanford BNS range [51,73] increased by 64% (from 66 Mpc to 108 Mpc), and for Livingston by 53% (from 88 Mpc to 135 Mpc).

For Virgo, major upgrades included; replacement of the steel wire suspensions of the four test masses with fused-silica fibers [74], modification of the vacuum system to avoid dust contamination of the lowest suspension stage,

replacement of the main laser to increase power, installation of a squeezed vacuum source to reduce quantum noise [75], improvements in beam stability [76], and addressing issues with scattered light. Compared to the O2 run, the Virgo BNS range increased by 73% (from 26 Mpc to 45 Mpc).

The processing of the data recorded by the LIGO and Virgo detectors includes several steps that occur both in near-real time to allow for the broadcasting of public alerts, and in higher latency to shape the final data set and update the catalogs of GW events. Raw data calibration and the subtraction of noise from known instrumental sources, documented in Sec. II A, occur first and the GW strain data, reconstructed independently in each detector, are then jointly processed. Significant GW candidates are vetted with several data-quality tests as a part of the standard analysis procedure. This procedure is described in Sec. II B.

#### A. Calibration and noise subtraction

The strain data used for astrophysical analyses is derived from the optical power variations at the output ports of the interferometers. Calibration of the raw photodetector signal to GW strain requires a detailed understanding and modeling of the control system and optomechanical response of the interferometers throughout an observing run. This allows for accurate and reliable calibration of the strain and also for quantifying its systematic and statistical uncertainty. The detailed procedure for the calibration and the determination of the systematic and statistical uncertainty of the LIGO and Virgo detectors for O3 can be found in [77–79].

There are usually two calibrations applied to the data; a low-latency calibration and, if needed, an offline calibration. The low-latency (online) estimate of the strain uses the best models of the detector at the time of recording. However, over the course of any observing run, data drop-outs due to computer failures, incomplete modeling of the detector, and unknown residual systematic errors are often identified. The offline calibration incorporates the necessary corrections and improvements, producing a better calibrated strain with better known systematic uncertainty.

In addition, numerous noise sources and calibration lines that limit detectors' sensitivity are measured and linearly subtracted from the data [42,80–82]. This subtraction is performed online to generate the LIGO and Virgo low-latency strain data, and it is also performed when regenerating the LIGO offline strain data. Additionally, noise due to nonstationary coupling of the power mains with the LIGO detectors was subtracted from the offline data [42]. As an example of noise subtraction, Fig. 1 shows the improvement in the noise levels around the 60 Hz mains line in the Hanford detector, after nonlinear noise subtraction was applied to the strain time series. Taking as a figure of merit the BNS range of the detectors [51,73], the subtraction results in a median range increase of 0.9 Mpc for Hanford and 0.2 Mpc for Livingston.

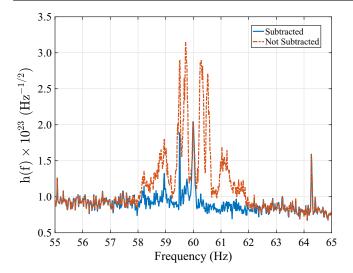


FIG. 1. Comparison of the amplitude spectral density at Hanford around the 60 Hz mains line, between data with subtracted nonstationary noise and data with no subtraction. The data correspond to a typical one-hour observation-ready data stretch during O3a.

In GWTC-2, search pipelines and parameter estimation analyses used a mix of low-latency and offline calibrated frames. In contrast to this, all searches and analyses presented in this paper use strain data with the best available calibration and noise subtraction for each detector. For LIGO, this corresponds to the offline recalibrated data with 60 Hz nonlinear subtraction. For Virgo, the online strain data stream was good enough to be used offline, except for the last two weeks of O3a which were reprocessed to improve subtraction of control and laser frequency noise [83]. The strain data used in this work are publicly accessible through the Gravitational Wave Open Science Center (GWOSC) [44,47].

In addition, the LIGO offline data are accompanied with a much improved systematic and statistical error estimate compared to the online data. The probability distribution of the calibration uncertainty estimate for LIGO in O3a is characterized in [77], with the systematic error over the detectors' bandwidth being under 3% in magnitude and under 2° in phase. The uncertainty in the Virgo strain data in O3a had a maximum systematic error over the detector's bandwidth under 5% in magnitude and under 2° in phase [78]. Parameter estimation takes into account calibration uncertainties, as described in Sec. V. Given the size of calibration uncertainties in O3, there is no evidence that they have a significant impact on the inference of source parameters [84,85].

#### B. Data quality, event validation and glitch mitigation

LIGO and Virgo data quality is continuously monitored during an observing run both on site and remotely, as reported in [86,87]. This can include, for example, internal

TABLE I. 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. II B. The minimum frequency is the lower limit of data used in analyses of GW source properties for the listed interferometer.

Name	Mitigation							
GW190413_134308	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 nonobserving							
	data used							
GW190924_021846	L1 glitch subtraction, glitch-only model							

detector summary pages which detail the status of the detectors and interferometer subsystems [88,89]. Feedback from GW searches also gives an indication of the impact of data quality on the sensitivity of a search. To exclude identified instances of poor data quality from the searches and produce the results in Sec. III, we used the same methods and data products as reported for GWTC-2 [8]. The data-quality products used in this work are publicly available [44,45].

Once a GW event has been identified by the search pipelines, we check the quality of data around the time of the event. We followed the same procedures outlined in [8] to validate the data quality around each new GW candidate reported in this paper. The aim of these validation procedures is to identify any instrumental or environmental noise that may impact the estimation of GW signal parameters. As summarized for GWTC-2 [8], in some cases shortduration noise transients, or glitches [86,90-92], can be subtracted from the data [93–96]. When this is not possible, analyses use tailored configurations, for example, a modified low-frequency cutoff, to exclude data that could be corrupted by the presence of a nearby glitch. The full list of candidate events using candidate-specific glitch mitigation, along with the mitigation configuration, is found in Table I. These data, for the events where the glitch-mitigated data was used for the parameter estimation analysis in Sec. V, are publicly accessible [46]. No candidates in this catalog have clear evidence of instrumental origin identified through data-quality validation studies.

## III. CANDIDATE IDENTIFICATION

GW data is analyzed to search for candidates in two stages; first in low-latency in order to generate public alerts that subsequently trigger followup astronomical observations, and then in higher latency in the form of an offline analysis of the archival strain data, which is used to create GW catalogs. Five pipelines were used in real time to analyze O3 data; a minimally modeled generic transient search (coherent WaveBurst [97–101]), and four matched-filter [51,52] pipelines (GstLAL [48–50], MBTA [56], PyCBC [53–55,102], and SPIIR [103]). Collectively, they identified 56 unretracted candidates during O3, 33 of which were found in O3a. GWTC-2 [8] presented 39 events identified by coherent WaveBurst, GstLAL, and PyCBC in the first offline search over O3a.

We present here results from a refined offline search of O3a. The search employs three matched-filter pipelines; GstLAL, PyCBC, and MBTA [56], marking the first time that MBTA results from archival data are presented and

included in a GW catalog. All three pipelines analyze the data from all three detectors. While GWTC-2 imposed a FAR ceiling of 2 per year on candidates, here we release a deep list of GW candidates with a FAR smaller than 2 per day [104]. In addition, we identify the 44 CBC candidates with an estimated  $p_{\rm astro}$  greater than 0.5 (Table II). There are also two candidates with  $p_{\rm astro}$  below 0.5 that do meet the FAR criterion used in GWTC-2; these are presented as marginal candidates. This GW catalog contains the largest number of candidates with  $p_{\rm astro}$  greater than 0.5 to date.

In Sec. III A, we first lay out a general description of matched filter searches and in Sec. III B, we describe the methods employed by the three CBC searches used in this work. We describe the search results in the following Sec. IV.

TABLE II. Above-threshold GW candidate list. We find 44 events that have  $p_{\rm astro}$  in at least one of the searches as greater than 0.5. Bold-faced names indicate the events that were not previously reported in GWTC-2 [8]. The candidates marked with an asterisk were first published in 3-OGC [17]. The second column denotes the observing instruments. Candidate events in GWTC-2.1 which do not meet the  $p_{\rm astro}$  threshold but were at the same time as above-threshold events are given in italics. The PyCBC and PyCBC -BBH, network SNRs do not include detectors with SNRs below 4; these events are marked with double dagger ( $^{\dagger}$ ) next to their network SNR. The four events marked with a dagger ( $^{\dagger}$ ) next to their FARs were found only in one detector by the GstLAL search. All four were detected using the data from LIGO Livingston. For the single-detector candidate events, the FAR estimate involves extrapolation. All single-detector candidate events in this list according to the FAR assigned to them are rarer than the background data of about six months collected in this analysis. Therefore, a conservative bound on the FAR for candidates denoted by  $^{\dagger}$  is  $\sim$ 2 yr<sup>-1</sup>. GstLAL FARs have been capped at  $1 \times 10^{-5}$  yr<sup>-1</sup> to be consistent with the limiting FARs from other pipelines. Dashes indicate that a pipeline did not find the event with a FAR smaller than the subthreshold FAR threshold of 2 per day.

		МВТА			GstL	AL		PyC	BC		PyCBC	-BBH	,
Name	Inst.	FAR (yr <sup>-1</sup> )	SNR	$p_{ m astro}$	FAR (yr <sup>-1</sup> )	SNR	$p_{ m astro}$	FAR (yr <sup>-1</sup> )	SNR	$p_{ m astro}$	FAR (yr <sup>-1</sup> )	SNR	$p_{ m astro}$
GW190403_051519	HLV										7.7	8.0	0.61
GW190408_181802	HLV	$8.7 \times 10^{-5}$	14.4	1.00	$< 1.0 \times 10^{-5}$	14.7	1.00	$2.5 \times 10^{-4}$	13.1‡	1.00	$< 1.2 \times 10^{-4}$	13.7‡	1.00
GW190412	HLV	$< 1.0 \times 10^{-5}$	18.2	1.00	$< 1.0 \times 10^{-5}$	19.0	1.00	$< 1.1 \times 10^{-4}$	$17.4^{\ddagger}$	1.00	$< 1.2 \times 10^{-4}$	17.9 <sup>‡</sup>	1.00
GW190413_052954	HLV							170	8.5	0.13	0.82	8.5	0.93
GW190413_134308	HLV	0.34	10.3	0.99	39	10.1	0.04	21	9.3 <sup>†</sup>	0.48	0.18	$8.9^{\ddagger}$	0.99
GW190421_213856	HL	1.2	9.7	0.99	0.0028	10.5	1.00	5.9	10.1	0.75	0.014	10.1	1.00
GW190425	LV				$0.034^{\dagger}$	12.9	0.78						
GW190426_190642	HLV										4.1	9.6	0.75
GW190503_185404	HLV	0.013	12.8	1.00	$< 1.0 \times 10^{-5}$	12.0	1.00	0.038	$12.2^{\ddagger}$	1.00	0.0026	$12.2^{\ddagger}$	1.00
GW190512_180714	HLV	0.038	11.7	0.99	$< 1.0 \times 10^{-5}$	12.2	1.00	$1.1 \times 10^{-4}$	$12.4^{\ddagger}$		$<1.1 \times 10^{-4}$	12.4‡	1.00
GW190513_205428	HLV	0.11	13.0	0.99	$1.3 \times 10^{-5}$	12.3	1.00	19	11.6‡	0.49	0.044	$11.8^{\ddagger}$	1.00
GW190514_065416	HL				450	8.3	0.00				2.8	8.4	0.76
GW190517_055101	HLV	0.11	11.3	1.00	0.0045	10.8	1.00	0.0095	$10.4^{\ddagger}$	1.00	$3.5 \times 10^{-4}$	10.3‡	1.00
GW190519_153544	HLV	$7.0 \times 10^{-5}$	13.7	1.00	$< 1.0 \times 10^{-5}$	12.4	1.00	$< 1.0 \times 10^{-4}$	$13.2^{\ddagger}$	1.00	$<1.1 \times 10^{-4}$	13.2‡	1.00
GW190521	HLV	0.042	13.0	0.96	0.20	13.3	0.79	0.44	$13.7^{\ddagger}$	0.96	0.0013	13.6‡	1.00
GW190521_074359	HL	$< 1.0\times 10^{-5}$	22.2	1.00	$< 1.0 \times 10^{-5}$	24.4	1.00	$< 1.8 \times 10^{-5}$	24.0	1.00	$< 2.3 \times 10^{-5}$	24.0	1.00
GW190527_092055	HL				0.23	8.7	0.85				19	8.4	0.33
GW190602_175927	HLV	$3.0 \times 10^{-4}$	12.6	1.00	$< 1.0 \times 10^{-5}$	12.3	1.00	0.29	11.9 <sup>‡</sup>	0.98	0.013	11.9 <sup>‡</sup>	1.00
GW190620_030421	LV				$0.011^{\ddagger}$	10.9	0.99						
GW190630_185205	LV				$< 1.0 \times 10^{-5}$	15.2	1.00				0.24	15.1	1.00
GW190701_203306	HLV	35	11.3	0.87	0.0057	11.7	0.99	0.064	11.9	0.99	0.56	11.7	1.00
GW190706_222641	HLV	0.0015	11.9	1.00	$5.0 \times 10^{-5}$	12.5	1.00	$3.7 \times 10^{-4}$	$11.7^{\ddagger}$	1.00	0.34	12.6‡	1.00
GW190707_093326	HL	0.032	12.6	1.00	$< 1.0 \times 10^{-5}$	13.2	1.00	$< 1.0 \times 10^{-5}$	13.0	1.00	$< 1.9 \times 10^{-5}$	13.0	1.00
GW190708_232457	LV				$3.1 \times 10^{-4\dagger}$	13.1	1.00						
GW190719_215514	HL										0.63	8.0	0.92

(Table continued)

TABLE II. (Continued)

		MB	TA		GstLAL			PyC	СВС		РуСВС-ВВН,		
Name	Inst.	FAR (yr <sup>-1</sup> )	SNR	$p_{ m astro}$	FAR (yr <sup>-1</sup> )	SNR	$p_{ m astro}$	FAR (yr <sup>-1</sup> )	SNR	$p_{ m astro}$	FAR (yr <sup>-1</sup> )	SNR	$p_{ m astro}$
GW190720_000836	HLV	0.094	11.6	1.00	$<1.0 \times 10^{-5}$	11.5	1.00	$1.4 \times 10^{-4}$	10.6 <sup>‡</sup>	1.00	$< 7.8 \times 10^{-5}$	11.4	1.00
GW190725_174728*	HLV	3.1	9.8	0.59				0.46	9.1 <sup>‡</sup>	0.96	2.9	$8.8^{\ddagger}$	0.82
GW190727_060333	HLV	0.023	12.0	1.00	$< 1.0 \times 10^{-5}$	12.1	1.00	0.0056	$11.4^{\ddagger}$	1.00	$2.0 \times 10^{-4}$	$11.1^{\ddagger}$	1.00
GW190728_064510	HLV	$7.5 \times 10^{-4}$	13.1	1.00	$<1.0\times10^{-5}$	13.4	1.00	$< 8.2 \times 10^{-5}$	13.0‡	1.00	$< 7.8 \times 10^{-5}$	$13.0^{\ddagger}$	1.00
GW190731_140936	HL	6.1	9.1	0.80	0.33	8.5	0.78				1.9	7.8	0.83
GW190803_022701	HLV	77	9.0	0.96	0.073	9.1	0.94	81	8.7 <sup>‡</sup>	0.17	0.39	$8.7^{\ddagger}$	0.97
GW190805_211137	HLV										0.63	8.3	0.95
GW190814	LV	$< 2.0 \times 10^{-4}$	20.4	1.00	$< 1.0 \times 10^{-5}$	22.2	1.00	0.17	19.5	1.00			
GW190828_063405	HLV	$< 1.0 \times 10^{-5}$	15.2	1.00	$< 1.0 \times 10^{-5}$	16.3	1.00	$< 8.5 \times 10^{-5}$	13.9 <sup>‡</sup>	1.00	$< 7.0 \times 10^{-5}$	15.9 <sup>‡</sup>	1.00
GW190828_065509	HLV	0.16	10.8	0.96	$3.5 \times 10^{-5}$	11.1	1.00	$2.8 \times 10^{-4}$	$10.5^{\ddagger}$	1.00	$1.1 \times 10^{-4}$	$10.5^{\ddagger}$	1.00
GW190910_112807	LV				$0.0029^{\ddagger}$	13.4	1.00						
GW190915_235702	HLV	0.0055	12.7	1.00	$< 1.0 \times 10^{-5}$	13.0	1.00	$6.8 \times 10^{-4}$	$13.0^{\ddagger}$	1.00	$< 7.0 \times 10^{-5}$	13.1‡	1.00
GW190916_200658*	HLV	$6.9 \times 10^{3}$	8.2	0.66	12	8.2	0.09				4.7	7.9	0.64
GW190917_114630	HLV				0.66	9.5	0.77						
GW190924_021846	HLV	0.0049	11.9	0.99	$< 1.0 \times 10^{-5}$	13.0	1.00	$< 8.2 \times 10^{-5}$	$12.4^{\ddagger}$	1.00	$8.3 \times 10^{-5}$	12.5‡	1.00
GW190925_232845*	HV	100	9.4	0.35				73	9.0	0.02	0.0072	9.9	0.99
GW190926_050336*	HLV				1.1	9.0	0.54				87	7.8 <sup>‡</sup>	0.09
GW190929_012149	HLV	2.9	10.3	0.6	4 0.16	10.1	0.87	120	9.4 <sup>‡</sup>	0.14	14	8.5‡	0.41
GW190930_133541	HL	0.34	10.0	0.87	0.43	10.1	0.76	0.018	9.8	1.00	0.012	10.0	1.00

#### A. Matched-filter searches

The matched-filter method relies on having a model of the signal, as a function of the physical parameters. The parameters include those that are intrinsic to the source; two individual component masses  $m_1$ ,  $m_2$  and two dimensionless-spin vectors  $\vec{\chi}_1, \vec{\chi}_2$  [related to each component's spin angular momentum  $\vec{S}_i$  by  $\vec{\chi}_i = c\vec{S}_i/(Gm_i^2)$ ], and seven extrinsic parameters that provide the orientation and position of the source in relation to the Earth; the luminosity distance  $D_{\rm L}$ , two-dimensional sky position (right ascension  $\alpha$  and declination  $\delta$ ), inclination between total angular momentum and line-of-sight  $\theta_{JN}$ , time of merger  $t_c$ , a reference phase  $\phi$ , and polarization angle  $\psi$ . The search pipelines create a template bank [105–107] of GW waveforms covering the desired intrinsic parameter space, and use these to filter against the data and produce signal-to-noise ratio (SNR) time series. The component masses describing template waveforms are affected by source redshift z as  $m_i^{\text{det}} = (1+z)m_i$ .

For each set of intrinsic parameters, extrinsic parameters affecting the signal's amplitude and phase may be maximized over analytically [51], if the signal can be approximated as a pure quadrupole mode, i.e.  $(\ell, |m|) = (2, 2)$ . In particular, for this search, the templates use only the dominant quadrupole mode and assume quasicircular orbits with component spins aligned with the total orbital angular momentum. Peaks in the resulting SNR time series are stored as triggers. GW candidates are formed by imposing consistency in time and in template intrinsic parameters

between triggers in different detectors; in addition, GstLAL also considers noncoincident triggers as candidates [48].

When considering a single template in a single detector with stationary, Gaussian noise, the matched filter SNR is an optimal statistic for ranking candidates. However, additional terms are needed to optimize sensitivity in searches of real data covering a wide signal parameter space. To account for the multidetector network, the distribution of signals over relative times, phases and amplitudes between detectors is considered [49,55]. Since detector noise is not stationary or Gaussian, signal-consistency tests such as chisquared [52] are calculated and used to rank candidates.

The distribution of noise triggers may vary strongly over the template masses and spins; we then model its variation empirically, as a function of combinations of parameters that are typically well-constrained by GW measurements. The binary's chirp mass [108],

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

determines to lowest order the phase evolution during the inspiral, and is typically better constrained than the component masses. At higher orders, the binary phase evolution is affected by the mass ratio  $q = m_2/m_1$  (where  $m_2 \le m_1$ ) and by the effective inspiral spin  $\chi_{\rm eff}$ , defined as [109]

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

TABLE III. Source probabilities ( $p_{\rm BBH}$ ,  $p_{\rm BNS}$ ,  $p_{\rm NSBH}$ ) for the high significance GW candidates listed in Table II for which  $p_{\rm BNS}$  or  $p_{\rm NSBH}$  is greater than 1%. For other events in Table II,  $p_{\rm astro} \approx p_{\rm BBH}$ , and therefore we do not list them here. Results are provided from all three matched-filter pipelines. Dashes indicate that a pipeline did not find the event with a FAR smaller than the subthreshold FAR threshold of 2 per day. The classification provided here assumes a boundary of  $3M_{\odot}$  between NSs and BHs in the case of GstLAL and PyCBC, and  $2.5M_{\odot}$  in the case of MBTA.

	MBTA					GstLAL				РуСВС				РуСВС-ВВН,		
Name	$p_{\mathrm{BBH}}$	$p_{ m NSBH}$	$p_{\mathrm{BNS}}$	$p_{ m astro}$	$p_{\mathrm{BBH}}$	$p_{ m NSBH}$	$p_{\mathrm{BNS}}$	$p_{ m astro}$	$p_{\mathrm{BBH}}$	$p_{ m NSBH}$	$p_{\mathrm{BNS}}$	$p_{ m astro}$	$p_{\mathrm{BBH}}$	$p_{ m NSBH}$	$p_{ m astro}$	
GW190425					0.00	0.00	0.78	0.78								
GW190707_093326	1.00	0.00	0.00	1.00	1.00	0.00	0.00	1.00	0.93	0.07	0.00	1.00	0.93	0.07	1.00	
GW190720_000836	1.00	0.00	0.00	1.00	1.00	0.00	0.00	1.00	0.95	0.05	0.00	1.00	1.00	0.00	1.00	
GW190725_174728	0.59	0.00	0.00	0.59					0.79	0.17	0.00	0.96	0.58	0.24	0.82	
GW190728_064510	1.00	0.00	0.00	1.00	1.00	0.00	0.00	1.00	0.97	0.03	0.00	1.00	0.97	0.03	1.00	
GW190814	0.93	0.07	0.00	1.00	0.19	0.81	0.00	1.00	0.54	0.46	0.00	1.00				
GW190924_021846	0.92	0.07	0.00	0.99	1.00	0.00	0.00	1.00	0.44	0.56	0.00	1.00	0.44	0.56	1.00	
GW190930_133541	0.87	0.00	0.00	0.87	0.76	0.00	0.00	0.76	0.93	0.07	0.00	1.00	0.85	0.15	1.00	

where  $M = m_1 + m_2$  is the total mass and  $\hat{L}_N$  is the unit vector along the Newtonian orbital angular momentum. Finally, the ranking of events by the search pipelines may account for an assumed prior distribution of signals over masses and spins [110,111].

The significance of each candidate event is quantified by its FAR, the estimated rate of events due to noise with equal or higher ranking statistic value. The FAR is calculated by each search pipeline by constructing a set of background samples designed to have the same distribution over ranking statistic as search events in the absence of binary merger GW signals.

By considering also the expected distribution of GW signal events recovered by a given search, we may derive an estimate of the relative probabilities of noise (terrestrial) origin  $p_{\text{terr}}$ , and signal (astrophysical) origin  $p_{\text{astro}}$  [26–28]. For the bulk of released events, detailed estimates of source parameters are not calculated. Therefore, based only on the matched-filter search results we also estimate the probability for each event to belong to three possible astrophysical binary source classes, labeled BNS, NSBH, and BBH. The classes are defined by binary component masses; BNS corresponds to  $\{m_1, m_2\} < 3M_{\odot}$ , NSBH to  $m_1 > 3M_{\odot}$ ,  $m_2 < 3M_{\odot}$ , and BBH to  $\{m_1, m_2\} > 3M_{\odot}$ . For MBTA, a  $2.5M_{\odot}$  cut is used instead of  $3M_{\odot}$ , with a gap to  $5M_{\odot}$  for BBH. These definitions are chosen for simplicity: they do not imply that every binary component within a given mass range is necessarily a neutron star (NS) or a black hole (BH). Such inference would ultimately require measurement of the effects of NS matter on observed signals, which is beyond the capabilities of the search pipelines. The probabilities for an event to belong to each class ( $p_{BNS}$ ,  $p_{\text{NSBH}}$ ,  $p_{\text{BBH}}$ , and  $p_{\text{terr}}$ ) are calculated from the template masses and spins recovered by the searches, under the assumption that events from each class occur as independent Poisson processes. The calculation also requires the choice of a prior on the event counts in each category [28]. GstLAL used a uniform prior for the BNS and NSBH categories, and a Poisson-Jeffreys prior for the BBH category; MBTA used a uniform prior for the BNS category, and a Poisson-Jeffreys prior for the NSBH and BBH categories; and PyCBC used a Poisson-Jeffreys prior for all three categories. Given the number of candidates, the prior choice does not significantly impact the BBH results. Implementation details differ between pipelines, as summarized below; the resulting probability estimates are listed in Tables II and III.

While the  $p_{\text{astro}}$  values given here represent our best estimates of the origin of candidates using the information available from search pipelines, they are subject to statistical (random) and systematic errors, as well as in some cases clearly differing for a given candidate between different pipelines. One such uncertainty arises from methods used to rank events between pipelines, including tests for noise artifacts; such tests, such as chi-squared statistics, will in general add (different) random variations to the ranking of a given event, in addition to their differing power in distinguishing signals from artifacts. For singledetector candidates, there is an additional inherent uncertainty in estimating the rate of comparable noise events, which may only be bounded to (less than) 1 per observing time. An inherent source of potential systematic error also lies in the search ranking statistic used in the calculation of  $p_{\text{astro}}$ ; such statistics are optimized to detect a specific (usually broad) distribution of signals over binary intrinsic parameters. The resulting  $p_{\text{astro}}$  estimates may be biased if this distribution deviates significantly from the (unknown) true signal distribution. The risk of such bias is largest for regions of parameter space containing few, or zero, confirmed detections. For all these reasons, our current  $p_{\rm astro}$ values may be revised in the future, particularly as and when current uncertainties in the true signal rate and distributions are eventually reduced.

We next review specific methods used by individual matched-filter pipelines.

## **B.** Search pipelines

In this section we describe the pipelines that were used to identify the candidates presented in GWTC-2.1.

#### 1. GstLAL

The GstLAL analysis used in this search is similar to the one used in the previous analysis for GWTC-2 [8]. The template bank used in this analysis is identical to the one used by GstLAL for GWTC-2 [8]. It covers waveforms with redshifted total masses from  $2M_{\odot}$  to  $758M_{\odot}$ , and spins that are aligned or antialigned with the binary's orbital angular momentum. The template bank is constructed using a stochastic placement method in five different regions of the parameter space [8]. The ranking statistic used by the analysis is the log-likelihood ratio  $\mathcal{L}$ used in the previous analysis [8]. Improvements have been made to the input data products generated by iDQ, the statistical inference framework to autonomously detect non-Gaussian noise artifacts in strain data based on auxiliary witness sensors [112,113]. This iDQ timeseries is used to compute one of the terms in the log-likelihood ratio within the GstLAL analysis, that informs the search of the presence of non-Gaussian noise in close proximity to a GW candidate. Compared to GWTC-2, the timeseries generated by iDQ was reprocessed offline, having access to an expanded set of auxiliary witness sensors and trained with an acausal binning scheme [112]. As a result, the generated iDQ timeseries performs better in identifying noise artifacts in strain data. In addition, for GWTC-2 the iDQ term was only used when ranking single-detector triggers, whereas now it is used for both coincident and single-detector triggers. Because of changes in the iDQ term, the empirically determined penalty for single-detector candidates had to be retuned compared to GWTC-2, and was increased to a penalty of  $\Delta \mathcal{L} = -12$  from  $\Delta \mathcal{L} = -10$ . The single-detector event penalty is determined by comparing the recovery of simulated signals in single detector versus combinations of detectors and the sensitive volumetime for each configuration.

For the GstLAL analysis,  $p_{\text{terr}}$  and  $p_{\text{astro}}$  shown in Tables II and III are estimated following the multicomponent population analysis [26,114]. The response of each GstLAL template to each astrophysical source class, computed semi-analytically [111], is used in estimating these probabilities. The volume-time sensitivity of the pipeline used in this calculation is estimated based on simulated sources injected into the pipeline and is rescaled to the astrophysical distribution [115]. The volume-time ratios are used to combine triggers from various observation runs and perform a multicomponent analysis yielding  $p_{\rm astro}$  and merger rates [26,114] inferred from O1 to O3a. The astrophysical distribution assumed in this analysis uses a log-uniform distribution for the source component masses, the component spins aligned with the orbital angular momentum, and a uniform distribution for the component spin magnitudes. The BH masses in BBHs and NSBHs are distributed between  $3M_{\odot}$  and  $300M_{\odot}$  with aligned component spins distributed in the range [-0.99, 0.99]. The NS masses in NSBHs and BNSs are distributed between  $1M_{\odot}$  and  $3M_{\odot}$ . In NSBHs, the NS spins are assumed to be aligned and distributed in the range [-0.4, 0.4], whereas, in BNSs the NSs are assumed to have small spins in the range [-0.05, 0.05]. These choices match previous analyses [8].

#### 2. MBTA

The Multiband Template Analysis (MBTA) pipeline [56] is based on matched filtering, relying on coincidences between triggers observed in different detectors. The version used for the offline search is close to the online version which contributed to the LVC public alerts [116]. The archival-search version benefits from offline-specific improvements, with a background estimate made over a longer duration, and with a reranking of the candidates using information collected not just before but also after the candidate.

The parameter space covered by this analysis ranges from  $1M_{\odot}$  to  $195M_{\odot}$  for the primary (more massive) component, with total masses up to  $200M_{\odot}$ ; or from  $1M_{\odot}$  to  $100M_{\odot}$  for the primary when the mass of the secondary is between  $1M_{\odot}$  and  $2M_{\odot}$ . Component spins are aligned with the total angular momentum and are limited to 0.05 for objects below  $2M_{\odot}$ , and going up to 0.997 for objects above  $2M_{\odot}$ . The waveform used for the search is SpinTaylorT4 [117–119] if both binary masses are lighter than  $2M_{\odot}$ , and SEOBNRv4 [120] if the mass of one of the components is above  $2M_{\odot}$ . The total number of templates in the bank used is 727,992. The SNR threshold for recording triggers in each detector is 4.5, or 4.8 if one of the components is above  $2M_{\odot}$ .

The FAR is calculated for each coincident event by forming random coincidences among single detector background triggers. This computation is performed independently for three large regions of the parameter space bounded by a  $2M_{\odot}$  limit for the mass of each component. These three regions are allowed to contribute equally to the background, while within each of them we sum the background contributions from all the templates.

The  $p_{\rm BNS}$ ,  $p_{\rm NSBH}$ ,  $p_{\rm BBH}$ , and derived  $p_{\rm astro}$  quantities are computed as the fraction of recovered simulated events, representative of an astrophysical population, to this foreground plus background estimate provided by the pipeline [121]. The parametrizations of the populations are described in Sec. IV D, with the POWER LAW + PEAK model used for BBH [122]. The rate of each type of source is adjusted using a multicomponent population analysis [26]. To follow the population and background evolution across the parameter space, 165 subregions are used. This finer resolution has the benefit of revealing events in population-rich areas, even if the overall background rate

for their ranking statistic value is larger than few per year, as in the case of the high-mass BBH event GW190916\_200658 presented in Table II.

## 3. PyCBC

In previous LVC searches [4,7,8,123], the offline PyCBC [54,124] pipeline has analyzed data only from the two LIGO detectors. In this analysis, PyCBC was extended to search data from the three-detector LIGO-Virgo network, along with updates to the event ranking statistic [102] and the  $p_{\rm astro}$  calculation and a new method to estimate source-class probability [125].

The PyCBC search uses the same template bank as in GWTC-2 [8], constructed using a hybrid geometric-random algorithm outlined in [126,127]. Peaks in SNR time series exceeding a threshold of four constitute single-detector triggers. Two-detector coincident events are formed from triggers with the same component masses and spins with a physically allowed time difference between detectors, allowing for timing errors. Three-detector triple coincidences require triggers in all pairs of detectors to pass this consistency test.

The detection statistic is given by the logarithm of the ratio of estimated signal-event rate density to noise-event rate density. We model the noise distribution in each detector as a decreasing exponential of the matched-filter SNR, reweighted based on a chi-squared signal-glitch discriminator [52,128], with parameters that depend on the template intrinsic parameters. The signal distribution includes terms accounting for dependence on relative times of arrival, phases and amplitudes between detectors, as well as relative sensitivities of the participating detectors [55]. We estimate the FAR separately for each combination of detectors via time-shifted analyses [54,129]. The significance for each candidate event is then found through addition of the FARs at the candidate's ranking statistic value over all active detector combinations [102].

In addition to the generic PyCBC search, which covers the full parameter space [8] including a range of possible signal types, we also conduct a focused PyCBC BBH search [8,14], capable of uncovering fainter BBH mergers by imposing a prior form for the signal distribution over the template bank [110]. This search is targeted at systems with mass ratios from 1 to 1/3, primary component masses from  $5M_{\odot}$  to  $350M_{\odot}$ , and aligned, equal component spins from  $\chi = -0.998$  to 0.998.

The inference of  $p_{\rm astro}$  and  $p_{\rm terr}$  for each candidate event employs a Poisson mixture model of signal and noise events [26–28]. Here, the distribution of signal events is estimated via a set of simulated signals analyzed by the pipeline, and the rate and distribution of noise events are estimated from time-shifted analyses [54]. In GWTC-2 the calculation was only performed on potential BBH events with template chirp mass above  $4.35M_{\odot}$  (which corresponds to equal  $5M_{\odot}$  component masses). Here, we include

potential BNS and NSBH events by performing independent calculations over ranges of template chirp mass below  $2.18M_{\odot}$  (corresponding to equal  $2.5M_{\odot}$  components), and between  $2.18M_{\odot}$ – $4.35M_{\odot}$ , respectively. Although the implied signal distribution over template chirp mass does not correspond to any specific astrophysical model, it is adequate for assignment of  $p_{\text{astro}}$  given the current knowledge of BNS and NSBH merger populations. Systematic biases in  $p_{\text{astro}}$  calculation may arise if the (unknown) true mass distribution is different from that assumed. The calculation is also extended relative to previous analyses to account for different possible coincident combinations of detectors [130]. The results given here are obtained from events occurring during O3a only, except for the BNS region where prior information of one highly significant detection was applied to represent GW170817 [5].

The estimation method for binary source-class probabilities [125] uses the binary chirp mass as input, and assumes a uniform density of candidate signals over the plane of component masses  $\{m_1, m_2\}$ . Here we take the classes to be defined by boundaries between different types of binary component at  $3M_{\odot}$ . To estimate source chirp mass, we correct the search template masses for cosmological redshift, using an estimate of the luminosity distance derived from the search SNRs and the corresponding templates' sensitivity. We then derive the relative probabilities of each source class and enforce that the sum of astrophysical source probabilities is equal to  $p_{\rm astro}$ .

#### IV. SEARCH RESULTS

We recover 1201 candidates that have FAR less than 2 per day in any of the search pipelines. These events and their estimated source probabilities are shown in Fig. 2. The candidates are shown in decreasing order of  $p_{\text{astro}}$ . The total sum of  $p_{astro}$  represents the Poisson rate of sources that pass the FAR threshold of 2 per day in each source class per O3a experiment, as estimated by the search pipelines. We find that this corresponds to between 24.95–44.50 signals in the BBH class, 0.66–3.80 signals in the NSBH class, and 0.22– 0.81 signals in the BNS class in O3a. The range represents the difference in the search pipelines. We do not consider the PyCBC-BBH analysis in the estimate of the number of signals in the BNS class provided here, as the analysis does not search over the BNS parameter space. Names are marked for the candidate events with  $p_{BNS}$  or  $p_{NSBH}$  greater than 20%. The dashed vertical line shows the least significant event with  $p_{\text{astro}}$  greater than 0.5. An estimate of the rate of sources in the subthreshold candidate list per O3a experiment is obtained by the contribution to the sum from events with  $p_{\text{astro}}$  less than 0.5. This corresponds to between 2.55-12.40 signals in the BBH class, 0.36-2.39 signals in the NSBH class, and 0.02-0.49 signals in the BNS class in the subthreshold candidates in O3a.

We find 44 high probability CBC candidates that have  $p_{\rm astro}$  greater than 0.5. These events are listed in Table II.

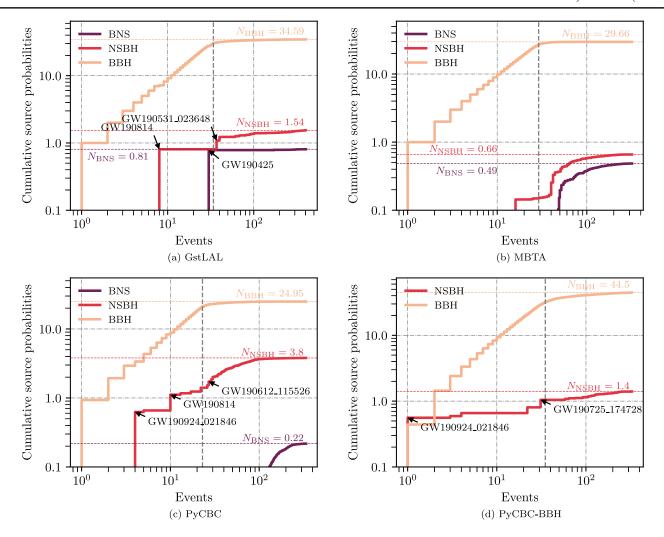


FIG. 2. Cumulative sum of  $p_{\rm BNS}$ ,  $p_{\rm NSBH}$ ,  $p_{\rm BBH}$  as a function of the candidates that pass a FAR threshold of 2 per day. The events are shown in decreasing order of  $p_{\rm astro}$ . The sum of the source probabilities shown here represents the estimated Poisson rate of sources in each source class per O3a experiment by the different search pipelines. An estimate of the rate of sources in the subthreshold candidate list is obtained by the contribution to the sum from events with  $p_{\rm astro}$  less than 0.5. This estimate yields between 2.55–12.40 signals in the BBH class, 0.36–2.39 signals in the NSBH class, and 0.02–0.49 signals in the BNS class in the subthreshold candidates in O3a. The dashed vertical gray line shows where this threshold is for each pipeline. Names are marked for the candidate events with  $p_{\rm BNS}$  or  $p_{\rm NSBH}$  greater than 20%, since these are of particular interest for cross-correlation studies.

This list includes eight new candidates that were not present in GWTC-2 [8]. These are marked in bold in Table II. Out of the 44 candidates, four were found with significant SNR only in one of the detectors by the GstLAL search, which is the only pipeline that looked for GW signals in single-detector data. These are listed with a dagger ( $^{\dagger}$ ) next to the FAR in Table II. For the majority of events listed in Table II,  $p_{\rm astro} \approx p_{\rm BBH}$ ; the exceptions are listed in Table III, which provides the list of candidates that have  $p_{\rm BNS}$  or  $p_{\rm NSBH}$  greater than 0.01.

#### A. New high probability candidates

We recover all the events found in GWTC-2 as having  $p_{\rm astro}$  above 0.5, with the exception of three: GW190424\_180648, GW190426\_152155, and GW190909\_114149.

Since the rate of BBH events detectable by the LIGO–Virgo detectors is greater than the rate of detectable BNS or NSBH events, the  $p_{\rm astro}$  for events in the BBH class is higher than that of the events in the BNS or NSBH class at a fixed FAR. Therefore, in switching to a  $p_{\rm astro}$  threshold from a FAR threshold, one can expect to add BBH events while dropping some low-mass events.

All the eight new candidates with  $p_{\rm astro}$  greater than 0.5 are classified as BBHs, that is,  $p_{\rm BBH}$  is greater than  $p_{\rm NSBH}$  and  $p_{\rm BNS}$ . Only one new candidate, GW190725\_174728, has a non-negligible probability in a source class other than BBH, with nonzero  $p_{\rm NSBH}$  (Table III). Out of the eight candidates, only two (GW190725\_174728 and GW190916\_200658) are assigned  $p_{\rm astro} > 0.5$  by more than one pipeline. Differences between pipelines are expected, due to the effects of random noise fluctuations

TABLE IV. Marginal-significance GW event candidate list. There are two candidates that are found in at least one of the searches with a FAR less than 2 per year, but with a  $p_{\rm astro}$  smaller than 0.5 in all searches. The candidate in bold, GW190531\_023648, is a new candidate identified in GWTC-2.1, not included in GWTC-2. The column max  $p_{\rm astro}$  shows the astrophysical class assigned with highest probability. Both candidates are detected by GstLAL with a small FAR, and are assigned to the NSBH class with  $p_{\rm astro}$  and  $p_{\rm NSBH}$  smaller than 0.5.

			MBT	A		GstLA	AL .	РуСВС			
Name	Inst.	FAR (yr <sup>-1</sup> )	SNR	Max $p_{astro}$	FAR (yr <sup>-1</sup> )	SNR	Max $p_{astro}$	FAR (yr <sup>-1</sup> )	SNR	Max p <sub>astro</sub>	
GW190426_152155	HLV	32	9.8	$p_{\text{NSBH}} = 0.01$	0.91	10.1	$p_{\text{NSBH}} = 0.14$	43	8.8	$p_{\text{NSBH}} = 0.01$	
GW190531_023648	HLV	8.1	9.8	$p_{\rm BNS} = 0.05$	0.41	10.0	$p_{\text{NSBH}} = 0.28$	29	9.2	$p_{\text{NSBH}} = 0.01$	

on the different ranking statistics used, and due to different assumed signal distributions and other choices. In principle, a more accurate assessment of the candidates' origins could be obtained by considering information from all pipelines; however, this is not currently implemented as a quantitative measure. One of the events, GW190917 114630, is identified as a BBH by the GstLAL pipeline, with  $p_{BBH} = 0.77$  (Table II). However, when its source properties are inferred by followup pipelines, the mass parameters are found to be consistent with NSBH systems. Had it been classified as an NSBH to begin with by the search pipeline, the resulting  $p_{\text{astro}}$  would not have made the threshold of 0.5. There is also nonstationary noise in the LIGO Livingston detector at the time of this event, but we have no evidence that the FAR of the event is misestimated. Out of the eight new candidates, five candidates (GW190426 190642, GW190725 174728, GW190805 211137, GW190916 200658, and GW190925 232845) were identified in the LVC search for gravitationally lensed candidates in O3a data [29], while four candidates (GW190725 174728, GW190916 200658, GW190925 232845, and GW190926 050336) were also independently identified and presented in 3-OGC [17]. The source properties of all eight candidates are discussed in Sec. V D.

## B. GWTC-2 candidates with $p_{\rm astro} < 0.5$

The three events in GWTC-2 that have a  $p_{\rm astro}$  smaller than 0.5 in GWTC-2.1 analyses are as follows:

(1) GW190424\_180648: This event was found by GstLAL as a single detector BBH event in Livingston. However, the data surrounding this event recorded periodic glitching from a camera shutter and iDQ (Sec. III B 1) heavily downranked the time span surrounding this event [113]. Figure 4 of the paper describing this iDQ [113] shows both the inspiral track and the surrounding glitches in the time-frequency spectrogram surrounding this event and the response of iDQ. While the down-ranking due to iDQ for this particular event remains largely the same between GWTC-2 and GWTC-2.1, the retuning of the singles penalty (Sec. III B 1) in GstLAL for GWTC-2.1 caused the significance of the event to go down. Consequently, in GWTC-2.1,

- this event does not meet either the FAR threshold of 2 per year or the  $p_{\text{astro}}$  threshold of 0.5.
- (2) **GW190426\_152155**: This event is in the marginal-significance candidate list for GWTC-2.1 (Table IV); the FAR is similar to the one in GWTC-2 and still passed the threshold of 2 per year considered in the previous catalog. However, based on the masses recovered by the pipeline, it is assigned to the NSBH class with  $p_{\rm NSBH} = 0.14$ . The low  $p_{\rm astro}$  in the NSBH class is due to the fact that the inferred rate of detectable NSBHs is lower than that of detectable BBHs.
- (3) GW190909\_114149: This candidate BBH event was found as a coincident event in Hanford and Livingston detectors by GstLAL. It is recovered now with smaller SNR in the Hanford detector and is therefore ranked lower.

### C. Marginal-significance candidates

The two GW candidates that satisfy the FAR criteria used by GWTC-2, but do not have  $p_{\rm astro}$  greater than 0.5 are listed as marginal candidates in Table IV. Both these events were detected by GstLAL with a small FAR, and were assigned to the NSBH class with  $p_{\rm astro}$  and  $p_{\rm NSBH}$  smaller than 0.5. Since the rate of detectable signals in the NSBH class is smaller than that in the BBH class, the  $p_{\rm astro}$  for these are smaller than they would be in the BBH class at the same FAR.

#### **D.** Search sensitivity

As in GWTC-2 [8], we quantify the sensitivity of the search via a campaign of simulated signals injected into the O3a data and analyzed by the search pipelines. We use a BBH signal distribution adjusted over that used for GWTC-2 to give more even coverage of the inferred distribution from O1–O3a [122], changing specifically the distributions over binary mass ratio and redshift. In addition to the BBH set, we also inject BNS and NSBH sets of simulated signals into the data. The sets are generated in two stages: first, points are sampled out to the maximum redshift considered for each set, then the samples are reduced to sets of potentially detectable signals by imposing that the expected LIGO Hanford–LIGO Livingston network SNR, calculated using a representative noise

TABLE V. Measures of sensitivity for the search pipelines. We state the sensitive hypervolume  $\mathcal{V}$  for each of four assumed signal populations: a BBH population following the injected distribution, a BBH population given by the POWER LAW + PEAK model of [122], and BNS and NSBH populations following the injected distributions. We give estimates for each search pipeline independently at a FAR threshold of 2 per year, and for all pipelines combined, i.e. counting all injections detected in at least one pipeline at the given threshold.

		Injection pop	Sensitive hypervolume $V$ (Gpc <sup>3</sup> yr)							
	Mass distribution	Mass range $(M_{\odot})$	Spin range	Redshift evolution	Max. redshift	GstLAL	MBTA		PyCBC BBH	All
BBH (INJ)	$p(m_1) \propto m_1^{-2.35}$ $p(m_2 m_1) \propto m_2$	$   \begin{array}{c}     2 < m_1 < 100 \\     2 < m_2 < 100   \end{array} $	$ \chi_{1,2}  < 0.998$	$\kappa = 1$	1.9	0.258	0.196	0.194	0.234	0.308
BBH (POP)	POWER LAW + PEAK	(see text)	$ \chi_{1,2}  < 0.998$	$\kappa = 0$	1.9	1.22	0.885	0.914	1.20	1.44
BNS	uniform	$1 < m_1 < 2.5$ $1 < m_2 < 2.5$	$ \chi_{1,2} <0.4$	$\kappa = 0$	0.15	0.00594	0.00631	0.00657	• • •	0.00781
NSBH	$p(m_1) \propto m_1^{-2.35}$ uniform	$2.5 < m_1 < 60 \\ 1 < m_2 < 2.5$	$ \chi_1  < 0.998$ $ \chi_2  < 0.4$	$\kappa = 0$	0.25	0.0174	0.0165	0.0181	• • •	0.0221

power spectral density (PSD), be above a threshold of 6. Although this threshold is below the matched-filter SNRs of events we consider as high-significance candidates, for detection thresholds corresponding to FARs significantly higher than 2 per year (the value used in GWTC-2), the cut may remove a non-negligible fraction of potentially detectable signals, due to random fluctuations in matched-filter SNR. The results of this simulation campaign for all the search pipelines have been made available [131].

The BNS signals are generated using the SpinTaylorT4 waveform model [117,119], while the BBH and NSBH sets are generated using the SEOBNRv4PHM model [61–63]. For simulated signals with redshifted total mass below  $9M_{\odot}$ , the SEOBNRv4P model without higher-order multipole emission was used, as higher-order multipoles would lie above the data sampling Nyquist frequency. The component spin magnitudes  $|\chi_i|$  are distributed uniformly up to a maximum of 0.4 for NS components and 0.998 for BBH, with isotropically distributed orientations.

The signal distributions over sky direction and binary orientation are isotropic. The distributions over redshift are proportional to the comoving volume element  $\mathrm{d}V_\mathrm{c}/\mathrm{d}z$ , multiplied by a factor  $(1+z)^{-1}$  accounting for time dilation, and by a factor  $(1+z)^\kappa$  modeling possible evolution of the comoving merger rate density with redshift (as in Appendix E of the GWTC-2 population analysis [122]). A summary of the distributions of the three injection sets is given in Table V.

Given the merger distribution used for each injection set, the sensitivity of each search over the O3 data is quantified by relating the expected number of detections, at a specified significance threshold, to the local astrophysical merger rate as  $N_{\rm det} = \mathcal{V}R(z=0)$ , where  $\mathcal{V}$  is an effective sensitive hypervolume with units of volume × time. This effective hypervolume is estimated by counting the number of injected signals that are detected at the given threshold, here a FAR of 2 per year.

In addition to assumed merger distributions that follow those used for the injection sets, we also provide  $\mathcal V$  for a fiducial BBH population model representative of those found to have high-posterior probability in our population analysis of GWTC-2 [122]. We choose the POWER LAW + PEAK model (defined in Appendix B.2 of the GWTC-2 population analysis [122]) with parameters  $\alpha = 2.5$ ,  $\beta = 1.5$ ,  $m_{\text{min}} = 5M_{\odot}$ ,  $m_{\text{max}} = 80M_{\odot}$ ,  $\lambda_{\text{peak}} = 0.1$ ,  $\mu_m = 34M_{\odot}$ ,  $\sigma_m = 5M_{\odot}$ ,  $\delta_m = 3.5M_{\odot}$ , setting the redshift evolution to  $\kappa = 0$ . The sensitivity for this BBH population is evaluated via importance sampling [115,132] implemented via GWPOPULATION [133]. The effective hypervolume for each search and signal population is given in Table V.

### E. Rates of BBH and BNS events

The rates of BBH and BNS binary mergers in the local Universe were estimated in a companion paper [122] to GWTC-2, using the count of detected events with FAR below 1 per year, combined with estimates of search sensitivity to the respective populations. The BBH rate estimate was marginalized over uncertainties in the parameters of the population models used, while the BNS rate estimate assumed a population uniform in component masses between  $1M_{\odot}$  and  $2.5M_{\odot}$ . The merger rate of NSBHs was calculated following the discovery of GW200105\_162426 and GW200115\_042309 [134], and we do not update it here.

Here, we present complementary BBH and BNS rate estimates based solely on the matched filter search pipeline outputs, with methods that allow us to incorporate a large number of likely noise (background) events [26] and thus avoid potential bias due to an arbitrary choice of significance threshold. Such methods allow for both foreground (signal) and background event distributions with *a priori* unknown rates, considered as independent Poisson processes. Furthermore, for the GstLAL pipeline we employ a

multicomponent mixture analysis [114] to estimate the rates of events in several astrophysical classes (BNS, NSBH, and BBH) and terrestrial. Every trigger is assigned probabilities of membership in each class, as described in Sec. III B 1. For the MBTA and PyCBC rate estimates, only the BBH class is considered.

The merger rate estimate then arises from the number of search events assigned to each class, divided by the estimated search sensitivity obtained via injection campaigns reweighted to an astrophysical population model [115], as discussed in the previous section. The population models used here to quantify search sensitivity are in general different from those used to obtain source classification probabilities, described in Sec. III A.

In both the BBH and BNS cases, as for other rate interval estimates derived from search results [7], a Poisson-Jeffreys ( $\propto R^{-1/2}$ ) prior was used. The choice of prior has little influence on estimated BBH rate due to the large count of signals, but it has a nontrivial effect on the BNS rate estimate as compared to, for instance, a uniform prior.

BBH merger rate estimates are provided by the GstLAL, PyCBC-BBH, and MBTA pipelines. The astrophysical population assumed for measuring search sensitivities is given by the POWER LAW + PEAK model [122] with fiducial parameters as in Sec. IV D. The resulting merger rates are  $25.0_{-6.1}^{+7.2}$  Gpc<sup>-3</sup> yr<sup>-1</sup> for GstLAL,  $26.0_{-6.8}^{+8.2}$  Gpc<sup>-3</sup> yr<sup>-1</sup> for PyCBC -BBH, and  $25.6_{-7.8}^{+9.6}$  Gpc<sup>-3</sup> yr<sup>-1</sup> for MBTA. These estimates are fully consistent with the estimate of  $23.9_{-8.6}^{+14.3}$  Gpc<sup>-3</sup> yr<sup>-1</sup> as derived from GWTC-2 [122] using only significant (FAR  $< 1~{\rm yr}^{-1}$ ) events, and allowing for uncertainties in the population model parameters. Following the GWTC-2 analysis [122], we have not included the effect of calibration uncertainties in our rate estimates. A full quantitative analysis of such uncertainties would require accounting for possible frequency- and timedependent amplitude systematic errors [77]; these are typically  $\sim 3\%$  or less, corresponding to a  $\lesssim 10\%$  sensitive volume uncertainty which remains subdominant to the Poisson uncertainty in the signal counts [122].

Since the only significant event consistent with BNS merger in O3a, GW190425 [135], was observed in a single detector, it is present only in the GstLAL search results. Hence, we quote a BNS merger rate estimate only from the GstLAL pipeline, as we expect this to be more informative than estimates from pipelines that did not consider single-detector triggers. For measuring the search sensitivity to BNS mergers, we use the injected population described above in Sec. IV D, yielding an estimated merger rate  $286^{+510}_{-237}$  Gpc<sup>-3</sup> yr<sup>-1</sup>. This estimate is fully consistent within uncertainties with the simpler estimate of  $320^{+490}_{-240}$  Gpc<sup>-3</sup> yr<sup>-1</sup> derived using a fixed threshold in expected SNR to determine sensitivity to simulated signals [122].

#### V. ESTIMATION OF SOURCE PARAMETERS

The physical parameters  $\vec{\vartheta}$  describing each GW source binary, corresponding to individual entries from the list of events in Table II, are inferred directly from the data d and represented as a posterior probability distribution  $p(\vec{\vartheta}|d)$ . This probability distribution is evaluated through Bayes' theorem as

$$p(\vec{\vartheta}|d) \propto p(d|\vec{\vartheta})\pi(\vec{\vartheta}),$$
 (3)

with  $p(d|\vec{\vartheta})$  being the likelihood of d given a set of source parameters  $\vec{\vartheta}$ , and  $\pi(\vec{\vartheta})$  being the prior probability distribution assumed for those parameters.

The likelihood itself describes the assumptions of the underlying stochastic process generating the noise present in *d* from a given detector. This noise is assumed to be Gaussian, stationary and uncorrelated between pairs of detectors [136,137], as further discussed in Sec. II B. This yields a Gaussian likelihood [138,139], which for the *i*th detector used in a given analysis takes the form

$$p(d^{i}|\vec{\vartheta}) \propto \exp\left[-\frac{1}{2}\langle d^{i} - h_{\rm M}^{i}(\vec{\vartheta})|d^{i} - h_{\rm M}^{i}(\vec{\vartheta})\rangle\right],$$
 (4)

with  $d^i$  representing the data from this instrument.  $h_{\rm M}^i(\vec{\vartheta})$  is the binary waveform model  $h(\vec{\vartheta})$  calculated for  $\vec{\vartheta}$  after being projected onto the detector and adjusted to account for the uncertainty present in the offline calibration (as described in Sec. II) of  $d^i$  [140]. The final likelihood is evaluated coherently across the network of available detectors and is obtained by multiplication of the likelihoods in each detector.

The term from Eq. (4) in angle brackets,  $\langle a|b\rangle$ , represents a noise-weighted inner product [138,141]. In addition to  $d^i$  and  $h_M^i(\vec{\theta})$ , evaluating this inner product requires specification of the bandwidth to be used in the analysis as well as the PSD characterizing the noise process. The lowfrequency cutoff used in our analysis is set at  $f_{low} = 20$  Hz. Time-domain waveform models are generated starting at a frequency  $f_{\text{start}}$  such that the  $(\ell, |m|) = (3, 3)$  spherical harmonic mode of the binary inspiral signal, as estimated from a set of preliminary analyses [7,8], is present at  $f_{low}$ . The high-frequency cutoff  $f_{\rm high}$  is selected for each analysis as  $f_{\rm high} = \alpha^{\rm roll-off} f_{\rm Nyquist}$  such that the ringdown frequency of the  $(\ell, |m|) = (3,3)$  spherical harmonic mode, inferred from waveforms taken from the same set of preliminary analyses as mentioned above [7,8], occurs below  $f_{high}$ . The parameter  $\alpha^{\text{roll-off}}$  in this expression is a scale factor chosen in order to minimize the frequency roll-off effects caused by the application of a tapering window to the time-domain data [142]. The Nyquist frequency  $f_{\text{Nyquist}}$  is then selected as the smallest power-of-two-valued frequency which together with  $\alpha^{\text{roll-off}} = 0.875$  satisfies the constraint on  $f_{\rm high}$  specified above. Similarly, the duration of data d used in each analysis is determined from a requirement that the waveforms from previous analyses [7,8] as evaluated from  $f_{\rm low}=20$  Hz and rounding up to the next power-of-two number of seconds, are contained in the selected data segment. The PSD for each event is inferred directly from the same data that is to be used in the likelihood, through the parametrized model implemented in Bayes Wave [143,144]. From the inferred posterior distribution of PSDs, the median value at each frequency is then used in the final analysis [144,145].

A GW signal emitted from a binary containing two BHs can be fully characterized by  $\vec{\vartheta}$  containing a set of fifteen parameters, as introduced in Sec. III A, if the binary orbit is assumed to have negligible eccentricity. The mass and spin of the postmerger remnant BH, together with the peak GW luminosity, are calculated from the initial binary parameters using fits to numerical relativity (NR) [146–151].

For binaries expected to contain at least one NS, the time-evolution of the binary orbit is modified by the presence of matter and quantified in terms of the dimensionless quadrupole tidal deformability  $\Lambda_{1,2}$ , adding one more parameter for each NS. In addition to the quadrupole tidal effects, other matter effects are parametrized in terms of  $\Lambda_{1,2}$  using equation of state (EOS)-insensitive relations [152]. When a GW event is assumed to contain one or more neutron star, we do not report final masses or spins for the remnant object.

#### A. Waveform models

The binary properties of the observed GW events are characterized through matching against a set of waveform models. For the events identified as BBHs, with both components inferred to have masses above  $3M_{\odot}$ , we use the independently developed IMRPhenomXPHM [57–60] and SEOBNRv4PHM [61–63] models. Both waveform models capture effects from spin-induced precession of the binary orbit, as well as contributions from both the dominant and subdominant multipole moments of the emitted gravitational radiation.

IMRPhenomXPHM [57] describes the GW signal from precessing noneccentric BBHs and is part of the fourth generation of phenomenological frequency domain models. Precession is implemented via a twisting-up procedure, as for its predecessors IMRPhenomPv2 [153,154] and IMRPhenomPv3HM [155,156]. For this, an aligned-spin model defined in the coprecessing frame is mapped through a suitable frame rotation to approximate the multipolar emission of a precessing system in the inertial frame. The stationary phase approximation is used to obtain closed form expressions in the frequency domain [157].

The description for the precession dynamics is derived using a multiple scale analysis of the post-Newtonian (PN) equations of motion [158]. The underlying aligned spin model for IMRPhenomXPHM is IMRPhenomXHM [58–60], which calibrates the  $(\ell, |m|) = (2, 2), (2, 1), (3, 2), (3, 3)$  and (4, 4) spherical harmonic modes to hybrid waveforms constructed from NR waveforms and information from the PN and effective-one-body (EOB) descriptions for the inspiral. IMRPhenomXHM represents the amplitudes and phases of spherical or spheroidal harmonic modes in terms of piecewise closed form expressions, with coefficients that vary across the compact binary parameter space, which results in extreme compression of the waveform information and computational efficiency.

SEOBNRv4PHM comes from another waveform family that is primarily based on the EOB formalism where the relativistic two-body problem is mapped to motion of a single body in an effective metric. In this framework, analytical information from several sources, such as PN theory and the test-particle limit, is combined in a resummed form. This is complemented with insights from NR simulations that accurately model the strong-field regime and incorporated into the EOB waveforms via a calibration procedure. We use the SEOBNRv4PHM [61-63] model, which includes precession and modes beyond the dominant quadrupole. This model is based on the aligned-spin model SEOBNRv4HM [64] and is calibrated to NR in that regime. It features full two-spin treatment of the precession equations and relies on a twisting-up procedure to map aligned spin waveforms in the coprecessing frame to the precessing waveforms in the inertial frame [62,63].

For GW190917\_114630, the less massive component is indicated to lie below  $3M_{\odot}$  and hence to have a strong likelihood of being a NS instead of a BH. Following the discussion for GW190814 [41], the nature of the less massive compact object in GW190917\_114630 cannot be discerned from the GW data at present. This is primarily dependent on the unequal masses [159–161] which will lead the merger of the binary to occur before an eventual NS component could have been tidally disrupted for any realistic NS EOS [159]. The lack of an observable NS disruption thus removes the potential for the observed signal to contain any additional information above a point-particle baseline. For this reason, we present results for GW190917\_114630 and GW190814 based on the BBH waveform models discussed above.

For GW190425, the only O3a event in this catalog classified as a BNS, we follow previous analyses [8,135], and report findings using the IMRPhenomP\_NRTidal waveform model [65,66], which is based upon the BBH model IMRPhenomPv2 [153,162,163] with the addition of EOS dependent self-spin effects and contributions from tidal interactions tuned against NR and tidal EOB models. In order to reduce computational cost for the analysis of GW190425, a reduced-order quadrature method was applied to the IMRPhenomP\_NRTidal model used [164,165].

<sup>&</sup>lt;sup>1</sup>See Table E1 in [142] for precise definitions of all parameters used.

### **B.** Sampling methods

To represent the continuous posterior probability density functions in  $\vec{\theta}$ , we draw discrete samples from those distributions using three different methods. For analyses using IMRPhenomXPHM and IMRPhenomP\_NRTidal we use the Bilby inference package [142,166], together with the nested sampling [167] method implemented in the Dynesty sampler [168], or the Markov-chain Monte Carlo sampler implemented in the LALInference package [139,169–171]. An extensive set of comparison and verification studies for analyses done with both Bilby and LALInference shows consistency between the two inference variants [142]. For analyses using SEOBNRv4PHM, we use the RIFT package [172–175] which, due to a hybrid exploration of the parameter space split into intrinsic (masses and spins) and extrinsic parameters, is better suited for use with this more computationally expensive waveform model. The robustness and performance of RIFT is verified through a set of tests [175]. The Asimov library [176] is used to manage all stages of the parameter-estimation analyses. This includes the automated creation of common configurations used for the Bilby, LALInference and RIFT runs, and the actual initialization, maintenance and completion of the analyses. The results from all analyses are collected, again managed by Asimov, and presented in a common format using the PESummary package [177,178].

## C. Priors

The prior probability on  $\vec{\vartheta}$  is defined similar to GWTC-2 [8] as uniform in spin magnitudes and redshifted component masses (specified in the geocenter rest frame), and isotropic in spin orientations, sky location and orientation of the binary orbit. We also assume uncorrelated and

uniform prior probabilities for the tidal deformability parameters of the NSs in GW190425. The prior on the luminosity distance follows a distribution uniform in comoving volume, using a flat  $\Lambda$ CDM cosmology with Hubble constant  $H_0=67.90~{\rm km\,s^{-1}\,Mpc^{-1}}$  and matter density  $\Omega_{\rm m}=0.3065$  [179]. Masses reported in Sec. V D are defined in the rest frame of the original binary, and computed by dividing the redshifted masses by (1+z), with z calculated from the same cosmological model. For GW190425 we perform two separate analyses, differing in the spin magnitudes they allow with a low spin  $(|\vec{\chi}_1|<0.05)$  and a high spin  $(|\vec{\chi}_1|<0.89)$ , consistent with the choices made in GWTC-2 [8] for this binary.

All analyses account for uncertainties in the reported strain calibration [77,180]. The calibration uncertainties are described as frequency-dependent splines, defined separately for the strain amplitude and phase [181]. The coefficients at the spline nodes are allowed to vary along-side the binary signal parameters according to a Gaussian prior distribution set by the measured uncertainty at each node [140]. For analyses performed with the LALInference or Bilby inference packages, calibration uncertainties are marginalized over through direct sampling of the spline coefficients whereas RIFT analyses implement a likelihood reweighting method through importance sampling over an initial analysis where perfect calibration is assumed [182].

#### **D.** Source properties

In this subsection we report the inferred source properties of the eight new events reported in Table II. The source properties for the BBH events from the first and second observation runs, reported in GWTC-1 [7], together with the remaining 36 events from Table II are reported in

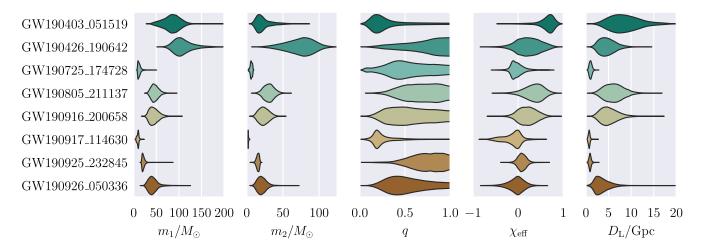


FIG. 3. Marginal posterior distributions on the primary mass  $m_1$ , secondary mass  $m_2$ , mass ratio q, effective inspiral spin  $\chi_{\rm eff}$  and luminosity distance  $D_{\rm L}$  for the eight events that are new to this catalog with  $p_{\rm astro} > 0.5$ , highlighted in bold in Table II. The vertical span for each region is constructed to be proportional to the one-dimensional marginal posterior at a given parameter value for the corresponding event. The posterior distributions are also represented numerically in terms of their one-dimensional median and 90% credible intervals in Table VI.

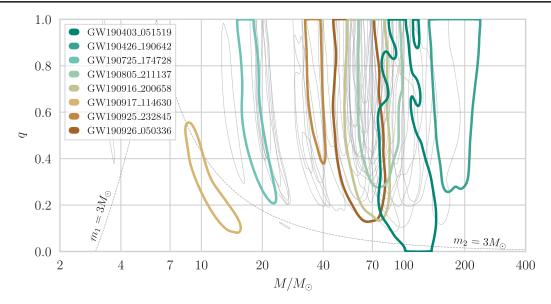


FIG. 4. Contours representing the 90% credible regions in the total mass M and mass ratio q plane for all events reported in this catalog. The events that are new to this catalog with  $p_{\rm astro} > 0.5$ , highlighted in bold in Table II, are highlighted in this figure following the same color scheme used in Fig. 3. The dashed lines act to separate regions where the primary and secondary binary component can have a mass below  $3M_{\odot}$ .

the Appendix. For the vast majority of the events reported both in this section and in the Appendix, the quoted source properties are taken from a set of posterior samples constructed from the two IMRPhenomXPHM and SEOBNRv4PHM analyses with each given equal weight. For a subset of events (GW151226, GW190413\_052954, GW190413\_134308, GW190421\_213856, GW190426\_190642, GW190521, GW190602\_175927, GW190719\_215514, GW190725\_174728, GW190803\_022701,

GW190814, GW190828\_063405, GW190828\_065509, GW190917\_114630, GW190926\_050336, and GW190929\_012149) the respective SEOBNRv4PHM analyses did not converge in a timely manner, hence we report results from the IMRPhenomXPHM only for these events.

A selection of the one-dimensional marginal posterior distributions are shown in Fig. 3, with two-dimensional projections on the M-q and  $\mathcal{M}-\chi_{\rm eff}$  planes in Figs. 4 and 5

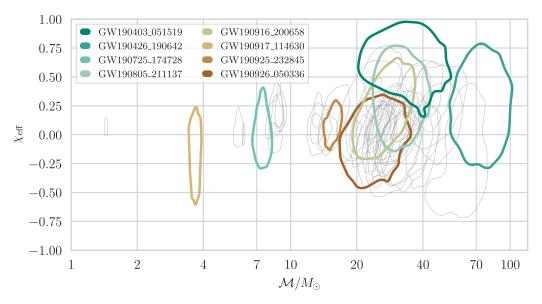


FIG. 5. Contours representing the 90% credible regions in the plane of chirp mass  $\mathcal{M}$  and effective inspiral spin  $\chi_{\rm eff}$  for all events reported in this catalog. The events that are new to this catalog with  $p_{\rm astro} > 0.5$ , highlighted in bold in Table II, are highlighted in this figure following the same color scheme used in Fig. 3.

TABLE VI. Median and 90% symmetric credible intervals for the one-dimensional marginal posterior distributions on selected source parameters for the eight events that are new to this catalog with  $p_{\rm astro} > 0.5$ , highlighted in bold in Table II. The columns show source total mass M, chirp mass  $\mathcal{M}$  and component masses  $m_i$ , dimensionless effective inspiral spin  $\chi_{\rm eff}$ , luminosity distance  $D_L$ , redshift z, final mass  $M_f$ , final spin  $\chi_f$ , sky localization  $\Delta\Omega$  and the network matched-filter SNR. The sky localization is the area of the 90% credible region. All quoted results are calculated from a set of posterior samples drawn with equal weight from the IMRPhenomXPHM and SEOBNRv4PHM analyses, with the exception of the SNRs that are taken from the IMRPhenomXPHM analysis alone (as RIFT, which was used for the SEOBNRv4PHM analysis, does not output that quantity). Additionally, following Sec. V D, the results presented for GW190426\_190642, GW190725\_174728, GW190917\_114630, and GW190926\_050336 are taken from an analysis using the IMRPhenomXPHM model only. A subset of the one-dimensional posterior distributions are visualized in Fig. 3. Two-dimensional projections of the 90% credible regions in the M-q and  $M-\chi_{\rm eff}$  planes are shown in Figs. 4 and 5.

Event	$M~(M_{\odot})$	$\mathcal{M}\;(M_{\odot})$	$m_1~(M_{\odot})$	$m_2~(M_{\odot})$	$\chi_{ m eff}$	$D_{\rm L}$ (Gpc)	Z	$M_{\rm f}~(M_{\odot})$	$\chi_{ m f}$	$\Delta\Omega~(deg^2)$	SNR
GW190403_051519	$106.6^{+26.7}_{-23.6}$	$34.0^{+15.1}_{-8.4}$	$85.0^{+27.8}_{-33.0}$	$20.0^{+26.3}_{-8.4}$	$0.68^{+0.16}_{-0.43}$	$8.28^{+6.72}_{-4.29}$	$1.18^{+0.73}_{-0.53}$	$102.2^{+26.3}_{-24.3}$	$0.91^{+0.05}_{-0.17}$	3900	$7.6^{+0.6}_{-1.1}$
GW190426_190642			$105.5^{+45.3}_{-24.1}$		$0.23^{+0.42}_{-0.41}$	$4.58^{+3.40}_{-2.28}$	$0.73^{+0.41}_{-0.32}$	$172.9^{+37.7}_{-33.6}$	$0.77^{+0.14}_{-0.16}$	4600	$8.7^{+0.4}_{-0.6}$
GW190725_174728	$18.3^{+7.4}_{-1.9}$	$7.4^{+0.5}_{-0.5}$	$11.8^{+10.1}_{-3.0}$	$6.3^{+2.1}_{-2.5}$	$-0.04^{+0.36}_{-0.16}$	$1.03^{+0.52}_{-0.43}$	$0.20^{+0.09}_{-0.08}$	$17.6^{+7.7}_{-1.8}$	$0.65^{+0.09}_{-0.07}$	2200	$9.1^{+0.4}_{-0.7}$
GW190805_211137	$76.7^{+19.5}_{-13.8}$	$31.9^{+8.8}_{-6.3}$	$46.2^{+15.4}_{-11.2}$	$30.6^{+11.8}_{-11.3}$				$72.4^{+18.2}_{-13.2}$	$0.82^{+0.09}_{-0.16}$	1600	$8.1^{+0.5}_{-0.7}$
GW190916_200658	$68.0^{+18.3}_{-13.1}$	$26.9^{+8.2}_{-5.4}$	$43.8^{+19.9}_{-12.6}$	$23.3^{+12.5}_{-10.0}$	$0.20^{+0.33}_{-0.31}$					2400	$8.1^{+0.3}_{-0.5}$
GW190917_114630	$11.8^{+3.0}_{-2.8}$	$3.7^{+0.2}_{-0.2}$	$9.7^{+3.4}_{-3.9}$	$2.1^{+1.1}_{-0.4}$	$-0.08^{+0.21}_{-0.43}$	$0.72^{+0.30}_{-0.31}$	$0.15^{+0.05}_{-0.06}$	$11.6^{+3.1}_{-2.9}$	$0.42^{+0.14}_{-0.05}$	1700	$8.3^{+0.5}_{-0.8}$
GW190925_232845	$36.7^{+3.6}_{-2.8}$	$15.6^{+1.1}_{-1.1}$	$20.8^{+6.5}_{-2.9}$	$15.5^{+2.5}_{-3.6}$	$0.09^{+0.16}_{-0.15}$	$0.93^{+0.46}_{-0.35}$	$0.19^{+0.08}_{-0.07}$	$34.9^{+3.5}_{-2.6}$	$0.71^{+0.06}_{-0.06}$	2900	$9.7^{+0.3}_{-0.6}$
GW190926_050336	$61.9_{-12.0}^{+22.7}$	$24.4^{+9.0}_{-4.9}$	$41.1^{+20.8}_{-12.5}$	$20.4^{+11.4}_{-8.2}$	$-0.02^{+0.25}_{-0.32}$				$0.64^{+0.14}_{-0.20}$	2000	$8.1^{+0.6}_{-0.8}$

respectively. A more detailed set of results are presented in Table VI in the form of median and 90% credible intervals for the one-dimensional marginal posterior distributions for all eight events. The complete multidimensional posterior distributions are available as part of the public data release accompanying this paper [183], as detailed further in Sec. VII.

#### 1. Masses

The masses inferred for the eight events presented in this section are generally comparable to, or higher, than the binaries reported in GWTC-2 [7,8], as shown in Fig. 4. We find that the most massive BBH in GWTC-2.1 is GW190426\_190642 with a total mass of  $182.3^{+40.2}_{-35.7}M_{\odot}$  and a remnant mass of  $172.9^{+37.7}_{-33.6}M_{\odot}$ ; it probably supersedes the previous most massive BBH GW190521² with total mass of  $153.1^{+42.2}_{-16.2}M_{\odot}$  and a remnant mass of  $147.4^{+40.0}_{-16.0}M_{\odot}$  as reported in Appendix A 2. Both GW190426\_190642 and GW190403\_051519 join GW190519\_153544, GW190521, GW190602\_175927, and GW190706\_222641 in a population of BBHs with over 50% posterior support for total mass  $M > 100M_{\odot}$  [8].

While the majority of the new events show a preference for mass ratios near unity, following the trend already observed in GWTC-2 [7,8], both GW190403\_051519 and GW190917\_114630 recover posteriors with median  $q \sim 1/5$  with  $q = 0.23^{+0.57}_{-0.12}$  and  $q = 0.21^{+0.32}_{-0.09}$  respectively. As shown in Fig. 4, this constraint for unequal masses is robust

at the 90% credible level for both GW190403\_051519 and GW190917\_114630. Although the contour indicating the 90% credible region for GW190403\_051519 includes support at  $q \sim 0$  in Fig. 4, this is an artifact of the bounded kernel density estimation used to construct the contours, and for this event there are no samples at the prior boundary of q = 0.05.

#### 2. Spins

The best measured spin parameter for CBCs with observable inspiral signals tends to be the effective inspiral spin  $\chi_{\rm eff}$  [184–186], introduced in Eq. (2), which is approximately conserved under spin-induced precession of the binary orbit [187–190]. Consequently, the angles between the spin-vectors and the orbital angular momentum at a formally infinite separation are well defined [190]. We therefore report  $\chi_{\rm eff}$ , as well as the spin-tilt angles themselves, at this fiducial reference point of infinite binary separation, or equivalently at an infinite time before the binary merger. The spins are evolved to infinite separation [191] using a precession-averaged evolution scheme [158,190] where the orbital angular momentum is computed using higher-order PN expressions.

The posterior distributions for  $\chi_{\rm eff}$  for all eight events are shown in Figs. 3 and 5. Again, the majority of the binaries are consistent with containing two nonspinning BHs with only GW190403\_051519 and GW190805\_211137 recovering a nonzero  $\chi_{\rm eff}$  at 90% credibility. Both binaries report predominantly positive  $\chi_{\rm eff}$ , further strengthening the pattern of a surplus of events with  $\chi_{\rm eff} > 0$  relative to those with  $\chi_{\rm eff} < 0$  reported in GWTC-2 [8] and investigated further in a companion paper [122].

<sup>&</sup>lt;sup>2</sup>In GWTC-2, GW190521 was inferred to have a total mass of  $163.9^{+39.2}_{-23.5}M_{\odot}$  and remnant mass of  $156.3^{+36.8}_{-22.4}M_{\odot}$  [8].

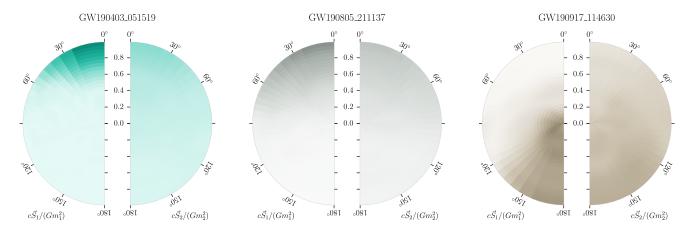


FIG. 6. The dimensionless spin parameters  $\vec{\chi}_i = c\vec{S}_i/(Gm_i^2)$  estimated for individual binary components of selected sources. The radial distance of a given pixel on the left (right) of each disk, away from the center of the circle, corresponds to  $|\vec{\chi}|$  for the more (less) massive compact object. Each pixel's angle from the vertical axis represents  $\theta_{LS}$ , the angle between the spin vector  $\vec{S}$  and the Newtonian orbital angular momentum. All pixels have equal prior probability with the shading denoting the relative posterior probability of the pixels, after marginalization over azimuthal angles. The events follow the same color scheme used in Fig. 3.

Similar to the compact objects reported in GWTC-2 [7,8], the majority of the compact-object spins reported in GWTC-2.1 have magnitudes consistent with zero. Two of the new events show evidence for large BH spins. In the case of GW190403\_051519, 82% of the posterior probability lies in a region where at least one of the component spin magnitudes is above 0.8 whereas for GW190805\_211137 this holds for 59% of the posterior probability.

For binaries with very unequal masses, measurements of  $\chi_{\rm eff}$  can translate into strong measurement constraints of  $\chi_1$ , the spin magnitude of the more massive object, whose spin angular momentum dominates over the secondary. This is the case for GW190403\_051519, whose primary dimensionless spin is measured to be  $\chi_1 = 0.89^{+0.09}_{-0.31}$ . This represents the most nearly extremal spin observed using GWs. Similarly, GW190805\_211137 is recovered with  $\chi_1 = 0.75^{+0.22}_{-0.59}$ and GW190917\_114630 with  $\chi_1 = 0.23^{+0.63}_{-0.21}$ . Both GW190403\_051519 and GW190805\_211137 are recovered as strongly preferring large  $\chi_1$ , with the inferred posterior distributions railing against the extremal BH-spin bound at  $\chi_1 = 1$ . Hence, we also report the one-sided 90% lower bounds of  $\chi_1 > 0.69$  for GW190403\_051519 and  $\chi_1 > 0.29$ for GW190805\_211137. The posterior distributions for the spin magnitudes and tilt angles for these three events are shown in Fig. 6.

#### 3. Three-dimensional localization

As the eight new events are all detected at relatively modest SNRs, together with several identifications as highmass BBHs, the inferred luminosity distances  $D_{\rm L}$  are generally larger than the binaries from GWTC-2 [7,8]. GW190403\_051519 is identified as probably the most distant event, with a recovered  $D_{\rm L}=8.28^{+6.72}_{-4.29}$  Gpc corresponding to a redshift  $z=1.18^{+0.73}_{-0.53}$  approximately twice as

distant as the most distant events that were reported in GWTC-2 [7,8] as also shown in Appendix A 2. In addition GW190426\_190642, GW190805\_211137, GW190916\_200658 and GW190926\_050336 all have inferred distances comparable to, or larger than, GW190413\_134308, further highlighting the access to the distant Universe provided in GWTC-2.1.

Another effect of the modest SNR of the new events is their comparatively poor localization on the sky. The best localized event is GW190805\_211137 with a 90% credible region of  $\Delta\Omega=1600~\text{deg}^2$ . The credible intervals for the inferred distances and sky areas are shown in Table VI. The inferred localizations for all events are available as part of the accompanying data release to this paper, detailed further in Sec. VII.

## 4. Waveform comparisons: Model systematics

The use of both the IMRPhenomXPHM [57-60] and SEOBNRv4PHM [61–63] models in the analyses of these events are motivated by the need to capture, and account for, potential differences in the inferred source parameters caused by the different methods used in the constructions of the models themselves. The vast majority of the posterior distributions reported in this section are constructed by combining an equal number of samples drawn from each of the IMRPhenomXPHM and SEOBNRv4PHM analyses [140]. For the majority of the eight new events, the differences between the two single-model analyses, as well as to the combined-model results, are found to be comparable to the impact of model systematics effects identified in GWTC-2 [7,8] being generally subdominant to the statistical uncertainty caused by the noisy data. For GW190403\_051519 there are, however, slight differences identified between the IMRPhenomXPHM and

SEOBNRv4PHM analyses, most noticeably in the shape and structure of the marginal posterior distribution of some of the recovered mass and spin parameters. In these cases, the differences between analyses using either the IMRPhenomXPHM or SEOBNRv4PHM models are dominating over the other systematic uncertainties of the analysis, such as the estimation of the noise PSD. A deeper investigation into the broader impact of these model systematic effects, and their impact on the inferred source parameters for the population of GW events presented here, is left for a future study.

## 5. Comparison to 3-OGC

Out of the eight new events presented in this section, GW190725 174728, GW190916 200658, GW190925 232845 and GW190926 050336 were also independently identified and analyzed as part of 3-OGC [17] using the PyCBC Inference package [192] and the IMRPhenomXPHM waveform model. We compare the inferred source properties for these events as presented in 3-OGC [193] and, to minimize potential model systematic effects, the IMRPhenomXPHM analysis performed for GWTC-2.1 presented here. Overall, we find a broad agreement between the two analyses. While there are differences found in the two sets of posterior distributions, they appear consistent within expectations from the differing choices of the analysis configurations and the assumed prior distributions between the two analyses for low SNR signals [194].

## VI. ASTROPHYSICAL IMPLICATIONS

Our analysis reports eight new candidates with  $p_{\rm astro} > 0.5$  in at least one pipeline. None of these candidates have  $p_{\rm astro}$  equal to 1 (Table II). Four of them were found only by a single analysis, and none were detected by all the pipelines (Table II). As discussed above in Sec. III A,  $p_{\rm astro}$  values are subject to statistical uncertainties, and are also subject to uncertainties arising from the true rate and distribution of signals. Such uncertainties are larger for events which, if astrophysical, fall within populations with few or zero significant detections. Here, we highlight such uncertainties for specific candidates, and discuss possible astrophysical implications under the hypothesis that the candidates do originate from compact object mergers.

Parameter estimation indicates that two of the new candidates, GW190403\_051519 and GW190426\_190642, if astrophysical, have sources with a large total mass ( $\gtrsim 100 M_{\odot}$ , Table VI). Both were found only by the PyCBC-BBH, analysis with a low SNR and relatively low  $p_{\rm astro}$ . They were also not recovered as significant events in the focused search of O3 data for intermediatemass BH binaries [195]. Since there is only one significant detection to date of a comparable BBH system, GW190521 [196,197], the calculation of  $p_{\rm astro}$  for these candidates is subject to significant potential systematic error. These

events are confidently above the break mass in the broken power-law mass distribution model, at  $39.7^{+20.3}_{-9.1}M_{\odot}$ , or the Gaussian in the POWER LAW + PEAK model at  $33.1^{+4.0}_{-5.6}M_{\odot}$ [122,198,199]. The estimated primary component masses, assuming astrophysical origin, are both above the lower edge of the pair-instability mass gap  $m_{\text{low}}$  [200–203], even considering the large uncertainties about its value  $(\approx 40-70M_{\odot}, [32-40])$ . Adopting a conservative estimate of  $m_{\text{low}} = 65 M_{\odot}$ , the primary component of GW190403\_ 051519  $(m_1 = 85.0^{+27.8}_{-33.0} M_{\odot})$  has a probability 0.16 of being below  $m_{\text{low}}$  with our standard mass prior. Similarly, GW190426\_190642's secondary component  $(m_2 = 76.0^{+26.2}_{-36.5} M_{\odot})$  has a probability of 0.30 of being below  $m_{\text{low}}$ , while its primary component  $(m_1 =$  $105.5^{+45.3}_{-24.1}M_{\odot}$ ) has a negligible probability of being below  $m_{\text{low}}$ . The upper edge of the mass gap is even more uncertain, with theoretical predictions suggesting  $m_{\mathrm{up}} \approx$  $120M_{\odot}$  [204,205]. The primary mass component of GW190403\_051519 (GW190426\_190642) has a probability 0.021 (0.25) of being above this value of  $m_{\rm up}$ . Thus, if astrophysical, GW190403 051519 and GW190426 190642 lie in the same group with GW190521; their primary components might be either inside or above the mass gap. Moreover, the estimated final mass of the merger remnant of GW190426\_190642  $(M_{\rm f} = 172.9^{+37.7}_{-33.6} M_{\odot})$  is in the intermediate-mass black hole regime  $(10^2-10^5M_{\odot})$ .

These features are suggestive of a dynamical formation channel, such as the hierarchical merger of smaller BHs [206-217] or repeated stellar collisions in dense star clusters [218–221]. In active galactic nuclei, the dense gaseous disk surrounding the central BH also triggers the hierarchical assembly of BHs [222–228]. Alternatively, extreme gas accretion from a dense gaseous disk [229–231] or from a stellar companion [232] might assist the growth of BH mass above the pair-instability threshold. Finally, primordial BHs might also have masses in the pairinstability gap [233,234]. However, even the formation of BHs in this mass range from stellar collapse cannot be excluded, given the large uncertainties in stellar-evolution models [36,39,40,235-237]. For example, very massive  $(\gtrsim 230 M_{\odot})$  extremely metal-poor  $(Z < 10^{-4})$  stars might turn into BHs with mass above the pair-instability gap [238-241].

Parameter-estimation analysis indicates a large positive value of the effective inspiral spin  $\chi_{\rm eff}=0.68^{+0.16}_{-0.43}$  and of the primary's spin magnitude  $\chi_1=0.89^{+0.09}_{-0.31}$  for GW190403\_051519. From a theoretical perspective, BH spin magnitudes are highly uncertain [235,242], with some models [243,244] predicting very low spins (~0.01) for single BHs because of efficient angular momentum transport in the stellar interior [245]. Observations of high-mass x-ray binaries in the local Universe indicate that BH spins can be nearly maximal [246,247], while the majority of mergers in GWTC-2 are associated with low values of  $\chi_{\rm eff}$ ,

with a slight preference for positive values [122]. Even if single stars form BHs with low spins [244], BHs in binaries may still develop high spins because of mass transfer [248], tidal interactions [242,249,250], or chemically homogeneous evolution [251,252]. Alternatively, BHs born from the merger of two smaller BHs are expected to have high natal spins ( $\sim 0.7-0.9$ , [147,148,150]). This might suggest that the primary component of GW190403\_051519 is a second-generation BH, which is also consistent with its large mass [208,209,217,253,254]. However, the positive effective inspiral spin  $\chi_{\rm eff}$  of GW190403\_051519 indicates a significant alignment of the spin vectors of (any of) the two components with the orbital angular momentum vector of the BBH. Nearly aligned spins are preferentially associated with isolated binary evolution [255,256], while dynamically formed binaries tend to have an isotropically distributed spin orientations [257,258].

Finally, GW190403\_051519 is associated with a comparatively small mass ratio q (Fig. 3). Such low values of the mass ratio are unusual in isolated binary evolution, especially for the chemically homogeneous evolution [251,259] but also for the common-envelope scenario [235,260–263]. In contrast, low mass ratios are expected if the primary and secondary components are a second- and a first-generation BH, respectively [211,212,214], or if the primary BH is the result of a stellar merger in a young star cluster [219].

Four of the other new candidates (GW190805 211137, GW190916\_200658, GW190925\_232845, GW190926\_ 050336) fall in the mass range of the bulk of GWTC-2 BBHs, while the secondary component of GW190725 174728 has a 0.18 probability of lying in the lower mass gap ( $\sim 2-5M_{\odot}$ ). The existence of a lower mass gap was inferred from observations of Galactic x-ray binaries [264–266], but there are a few observations of BHs with mass  $\approx 3-4M_{\odot}$  in noninteracting binary systems [267,268] and microlensing surveys find no evidence for a mass gap between NSs and BHs [269,270]. GWTC-2 BBH observations also suggest a dearth of systems between  $2.6M_{\odot}$ and  $6M_{\odot}$  [122,271]. The only confirmed GW event in GWTC-2 with a component in the lower mass gap is GW190814 [41]. Numerical and theoretical models do not exclude the formation of compact objects in this mass range from a core-collapse supernova [272–275]. Other scenarios to explain the formation of binary compact objects in this mass range include mergers in multiple systems [276–279], primordial BHs [233,280] and mass accretion onto a neutron star [281].

Finally, GW190917\_114630 has component masses consistent with an NSBH ( $m_1 = 9.7^{+3.4}_{-3.9} M_{\odot}$ ,  $m_2 = 2.1^{+1.1}_{-0.4} M_{\odot}$ ), but was identified only as a BBH candidate, with  $p_{\rm NSBH} = 0$  and  $p_{\rm BBH} = 0.77$ , by the pipeline that detected it (GstLAL). Since GW190426\_152155 is a marginal candidate in this catalog, due to its low  $p_{\rm astro}$  (Table IV), GW190917\_114630 is the only high-probability candidate with mass components

in the NSBH range. However, as discussed in Sec. IV A, had it been classified as an NSBH to begin with, its  $p_{astro}$ measured by GstLAL would have been smaller due to the lower foreground rate of NSBHs as compared to BBHs in the detection pipelines, and not passed the threshold of 0.5 considered by the followup pipelines. As with the unusually high-mass BBH candidates, the assignment of  $p_{astro}$  for NSBHs is subject to potential systematic error since no NSBH events have been confidently detected in the data set up to O3a used here, although there were NSBH discoveries in O3b [67,134]. The masses and effective inspiral spin of this candidate are consistent with prior expectations for NSBH systems [260,282–288]. Inferring the impact on the overall population of binary compact objects of the new candidates, including those with non-negligible probability of noise origin, requires a more involved analysis which is beyond this scope of this work [289,290].

#### VII. CONCLUSION

We have presented GWTC-2.1, which includes results from a refined search for CBCs in the first part of the third observing run of the Advanced LIGO and Advanced Virgo detectors. This is an extension to the previous GW catalog, GWTC-2 [8], over the same data, and provides a deeper list of GW candidates. The search we presented here was carried out using three matched-filter pipelines, MBTA, GstLAL, and PyCBC, and includes a list of candidates that have a FAR less than 2 per day in any of the pipelines. We provide detailed source properties of the eight events that have  $p_{\rm astro}$  greater than 0.5 and were not present in GWTC-2. In addition, the source properties of previously reported events with  $p_{\rm astro}$  greater than 0.5 are presented in the Appendix.

Out of the eight new candidates presented here, all events have masses consistent with BBH sources with the exception of GW190917\_114630, whose source masses are consistent with being an NSBH (Sec. VD). If astrophysical, these events expand the scope of observed BBHs, with several binaries inferred at larger distances than previous detections and with both a new broader range of recovered BH masses and the addition of two binaries with significantly unequal masses. The primary components of two of the new candidates (GW190403 051519 and GW190426 190642) lie inside or, less likely, above the pair-instability mass gap. GW190403\_051519 also shows support for high-spin, unequal masses, and remnant mass in the intermediate-mass BH regime. These features are suggestive of dynamical formation, by hierarchical BH merger or by stellar collisions in dense stellar clusters or active galactic nuclei. However, we cannot exclude that GW190403\_051519 and GW190426\_190642 originated from isolated binary systems, because of the large uncertainties in the mass range of the pair-instability mass gap. Among the new candidates, GW190725\_174728 shows some support for a secondary component mass in the lower mass gap  $(2-5M_{\odot})$ . GW190917\_114630, the only candidate with component masses consistent with an NSBH was initially classified as a BBH by the search pipeline, and therefore the  $p_{\rm astro}$  assigned to it is subject to systematics due to uncertainty in classification.

The data products associated with GWTC-2.1 include candidate information from relevant search pipeline(s) and localizations for all events that pass a threshold of 2 per day in any search pipeline. The information from each search pipeline includes the template mass and spin parameters, the SNR time series, chi-squared values, the time and phase of coalescence in each detector, FAR, and  $p_{\text{astro}}$  (Sec. III A). These data can be found at Zenodo [104]. The source localizations are computed using the rapid localization tool BAYESTAR [291,292], which was also used to produce the localizations in near real time during the observing runs while sending out GW alerts. We also release the results of the search pipelines running over simulated signal sets classified as BNS, NSBH, and BBH [131] that were used to calculate the sensitivities shown in Table V. For candidates that have a  $p_{\text{astro}} > 0.5$ , we perform followup parameter estimation and also release the posterior samples associated with these events. These are available via Zenodo [183]. Finally, the strain data for O3a used for the analyses in this paper are also available [44,47].

The LVK have already announced the first observations from NSBHs [134] in the data from O3b, and the catalog that extends events up to O3b, GWTC-3 [67], has been released. GWTC-3 adds 35 GW candidates with  $p_{\rm astro}$  greater than 0.5 from O3b. O3 marks the most sensitive GW data published upon so far. The LIGO, Virgo, and KAGRA [293] detectors are currently offline and undergoing commissioning to enhance their sensitivities, and plan to all collect data simultaneously during the fourth observing run (O4) [68]. With further improvement in sensitivities and planning for premerger BNS detections [294–296], O4 offers improved prospects for GW and multimessenger astronomy, and promises to build upon our current knowledge of binary populations.

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# APPENDIX: ESTIMATION OF SOURCE PARAMETERS

# 1. Binary black holes from the first and second observing runs

In order to provide a self-consistent set of source properties, inferred using the state-of-the-art BBH waveform models described in Sec. VA, we have reanalyzed the 10 BBH events observed during O1 and O2, and reported in GWTC-1 [7]. We present results combining samples from analyses using both the IMRPhenomXPHM and SEOBNRv4PHM, with the exception of GW151226 which, as mentioned earlier in Sec. VD, was analyzed using IMRPhenomXPHM only. As the BNS models available at the time of GWTC-1 still can be considered state-of-the-art in the NS-physics they describe, we have elected to not reanalyze the BNS event GW170817 as part

of this study. For the source properties of GW170817, we instead refer to GWTC-1 [7] and its accompanying data release [306].

The source properties for the 10 BBH events from the O1 and O2 are reported in Table VII, with a selection of the one-dimensional marginal posterior distributions shown in Fig. 7. The two-dimensional projections on the M-q and  $\mathcal{M}-\chi_{\rm eff}$  planes are shown as light-gray contours in Figs. 4 and 5 respectively. The full 15-dimensional posterior distributions are available as part of the public data release accompanying this paper [183], as detailed further in Sec. VII.

Generally, the inferred source properties for these ten BBHs are consistent with those presented in GWTC-1 [7], but there are some new features worth highlighting. Where most binaries have a nominal support for  $\chi_{\rm eff}=0$ , GW151226 was in GWTC-1 identified to exclude this value at > 90% probability [7,307], a conclusion which is strengthened further as of the analysis presented here in GWTC-2.1. The other BBH in GWTC-1 with only marginal support for  $\chi_{\rm eff}=0$ , GW170729, is now found to include support for negative  $\chi_{\rm eff}$  in its 90% credible interval while also simultaneously preferring BH components with more unequal masses relative to what was inferred in GWTC-1.

Previous independent analyses of these ten events with the IMRPhenomXPHM model show broad consistency with the results presented in this section [308].

# 2. Previously reported binaries from the first half of the third observing run

The high-significance events from O3a are reported in Table II. Out of these events, 36 were included in GWTC-2 [8] with its accompanying data release [309]. Again, to

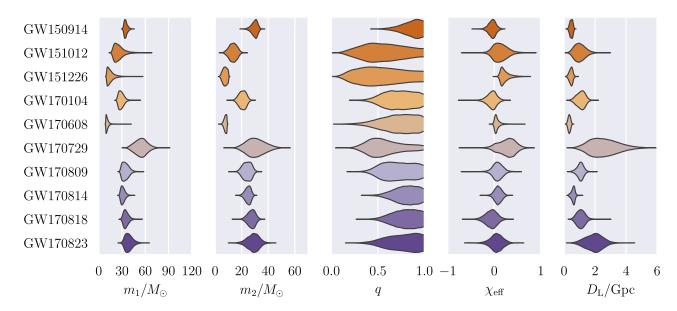


FIG. 7. Marginal posterior distributions on the primary mass  $m_1$ , secondary mass  $m_2$ , mass ratio q, effective inspiral spin  $\chi_{\rm eff}$  and luminosity distance  $D_{\rm L}$  for the 10 BBH events observed during O1 and O2. The vertical span for each region is constructed to be proportional to the one-dimensional marginal posterior at a given parameter value for the corresponding event. The posterior distributions are also represented numerically in terms of their one-dimensional median and 90% credible intervals in Table VII.

TABLE VII. Median and 90% symmetric credible intervals for the one-dimensional marginal posterior distributions on selected source parameters for the 10 BBH events observed during the O1 and O2. These binaries were reported in GWTC-1 [7]. The columns show source total mass M, chirp mass  $\mathcal{M}$  and component masses  $m_i$ , dimensionless effective inspiral spin  $\chi_{\rm eff}$ , luminosity distance  $D_{\rm L}$ , redshift z, final mass  $M_f$ , final spin  $\chi_f$ , sky localization  $\Delta\Omega$  and the network matched-filter SNR. The sky localization is the area of the 90% credible region. All quoted results are calculated from a set of posterior samples drawn with equal weight from the IMRPhenomXPHM and SEOBNRv4PHM analyses, with the exception of the SNRs that are taken from the IMRPhenomXPHM analysis alone (as RIFT, which was used for the SEOBNRv4PHM analysis, does not output that quantity). Additionally, following Sec. V D, the results presented for GW151226 are taken from an analysis using the IMRPhenomXPHM model only. A subset of the one-dimensional posterior distributions are visualized in Fig. 7. Two-dimensional projections of the 90% credible regions in the M-q and  $\mathcal{M}-\chi_{\rm eff}$  planes are shown in gray in Figs. 4 and 5.

Event	$M~(M_{\odot})$	$\mathcal{M}\;(M_{\odot})$	$m_1~(M_\odot)$	$m_2~(M_\odot)$	$\chi_{ m eff}$	$D_{\rm L}$ (Gpc)	z	$M_{\rm f}~(M_{\odot})$	$\chi_{ m f}$	$\Delta\Omega~(deg^2)$	SNR
GW150914	$64.5^{+3.7}_{-3.2}$	$27.9_{-1.5}^{+1.7}$	$34.6^{+4.4}_{-2.6}$	$30.0^{+2.9}_{-4.6}$	$-0.04^{+0.12}_{-0.14}$	$0.47^{+0.14}_{-0.16}$	$0.10^{+0.03}_{-0.03}$	$61.5^{+3.4}_{-2.9}$	$0.68^{+0.05}_{-0.05}$	250	$26.05^{+0.1}_{-0.2}$
GW151012	$38.8^{+10.3}_{-4.7}$	$15.6^{+2.3}_{-1.5}$	$24.8^{+14.5}_{-6.3}$	$13.6^{+4.5}_{-4.9}$	$0.12^{+0.28}_{-0.21}$	$1.00^{+0.64}_{-0.49}$	$0.20^{+0.11}_{-0.09}$	$37.1^{+10.6}_{-4.6}$	$0.69^{+0.13}_{-0.13}$	1700	$9.3^{+0.3}_{-0.5}$
GW151226	$21.7^{+8.3}_{-1.6}$	$8.9^{+0.3}_{-0.3}$	$14.2^{+11.1}_{-3.6}$	$7.5^{+2.4}_{-2.8}$	$0.20^{+0.23}_{-0.08}$	$0.46^{+0.16}_{-0.20}$	$0.10^{+0.03}_{-0.04}$	$20.7^{+8.6}_{-1.6}$	$0.75^{+0.12}_{-0.05}$	950	$12.7^{+0.3}_{-0.4}$
GW170104	$49.6^{+4.7}_{-3.6}$	$21.1^{+2.0}_{-1.5}$	$28.7^{+6.6}_{-4.2}$	$20.8^{+4.1}_{-4.7}$	$-0.04^{+0.15}_{-0.19}$	$1.11^{+0.39}_{-0.48}$	$0.22^{+0.07}_{-0.09}$	$47.5^{+4.5}_{-3.4}$	$0.67^{+0.06}_{-0.08}$	1000	$13.8^{+0.2}_{-0.3}$
GW170608	$18.5^{+2.0}_{-0.6}$	$7.9^{+0.2}_{-0.2}$	$10.6^{+4.0}_{-1.4}$	$7.8^{+1.2}_{-1.9}$	$0.05^{+0.13}_{-0.05}$	$0.34^{+0.12}_{-0.13}$	$0.07^{+0.03}_{-0.03}$	$17.7^{+2.1}_{-0.6}$	$0.69^{+0.03}_{-0.03}$	380	$15.3^{+0.2}_{-0.3}$
GW170729	$84.4^{+15.0}_{-10.9}$	$34.6^{+7.0}_{-5.7}$	$54.7^{+12.7}_{-12.8}$	$30.2^{+11.9}_{-10.2}$	$0.29^{+0.25}_{-0.33}$	$2.49^{+1.69}_{-1.23}$	$0.44^{+0.24}_{-0.19}$	$80.3^{+13.5}_{-10.2}$	$0.78^{+0.09}_{-0.22}$	830	$10.7^{+0.4}_{-0.5}$
GW170809	$58.5^{+5.3}_{-3.9}$	$24.8^{+2.2}_{-1.6}$	$34.1^{+8.0}_{-5.3}$	$24.2^{+4.8}_{-5.3}$	$0.07^{+0.17}_{-0.17}$	$1.07^{+0.31}_{-0.38}$	$0.21^{+0.05}_{-0.07}$	$55.7^{+5.0}_{-3.6}$	$0.71^{+0.08}_{-0.08}$	260	$12.8^{+0.2}_{-0.3}$
GW170814	$56.0^{+3.5}_{-3.0}$	$24.1^{+1.4}_{-1.2}$	$30.9^{+5.4}_{-3.3}$	$24.9^{+3.0}_{-4.0}$	$0.08^{+0.13}_{-0.12}$	$0.61^{+0.16}_{-0.23}$	$0.13^{+0.03}_{-0.05}$	$53.2^{+3.2}_{-2.7}$	$0.72^{+0.07}_{-0.06}$	92	$17.7^{+0.2}_{-0.3}$
GW170818	$62.5^{+5.3}_{-4.6}$	$26.8^{+2.3}_{-2.0}$	$34.8^{+6.5}_{-4.2}$	$27.6^{+4.1}_{-5.1}$	$-0.06^{+0.19}_{-0.22}$	$1.08^{+0.43}_{-0.41}$	$0.21^{+0.07}_{-0.07}$	$59.7^{+4.9}_{-4.2}$	$0.68^{+0.08}_{-0.08}$	35	$12.0^{+0.3}_{-0.4}$
GW170823	$67.0^{+10.3}_{-7.2}$	$28.6_{-3.3}^{+4.5}$	$38.3^{+9.5}_{-6.2}$	$29.0^{+6.5}_{-7.8}$	$0.05^{+0.21}_{-0.22}$	$1.97^{+0.84}_{-0.93}$	$0.36^{+0.13}_{-0.15}$	$63.9^{+9.6}_{-6.8}$	$0.71^{+0.08}_{-0.10}$	1800	$12.2_{-0.3}^{+0.2}$

ensure a self-consistent set of inferred source properties available for all CBC events observed by Advanced LIGO and Advanced Virgo, we provide a reanalysis of these 36 events using the BBH waveform models described in Sec. VA. We present results combining samples from analyses using both the IMRPhenomXPHM and SEOBNRv4PHM, with the exception of GW190413\_052954, GW190413\_134308, GW190421\_213856, GW190521, GW190602\_175927, GW190719\_215514, GW190803\_022701, GW190814, GW190828\_063405, GW190828\_065509 and GW190929\_012149 which, as

mentioned earlier in Sec. V D, were analyzed using IMRPhenomXPHM only. As also described in Sec. V A, for the BNS event GW190425, the IMRPhenomP\_NRTidal waveform model [65,66] was used. The analyses of these events also used the GW strain data described in Sec. II A, an additional improvement over the analyses presented in GWTC-2 [8]. For the events listed in Table I all analyses made use of data which included glitch subtraction or a reduction in the bandwidth available for astrophysical inference.

The source properties for the 36 events from O3a are reported in Table VIII, with a selection of the

TABLE VIII. Median and 90% symmetric credible intervals for the one-dimensional marginal posterior distributions on selected source parameters for the 36 events from Table II that were not reported in Table VI. The columns show source total mass M, chirp mass  $\mathcal{M}$  and component masses  $m_i$ , dimensionless effective inspiral spin  $\chi_{\rm eff}$ , luminosity distance  $D_{\rm L}$ , redshift z, final mass  $M_{\rm F}$  final spin  $\chi_{\rm ff}$ , sky localization  $\Delta\Omega$  and the network matched-filter SNR. The sky localization is the area of the 90% credible region. The results for the BBHs are calculated from a set of posterior samples drawn with equal weight from the IMRPhenomXPHM and SEOBNRv4PHM analyses, with the exception of the SNRs that are taken from the IMRPhenomXPHM analysis alone (as RIFT, which was used for the SEOBNRv4PHM analysis, does not output that quantity). Additionally, following Sec. V D, the results for GW190413\_052954, GW190413\_134308, GW190421\_213856, GW190521, GW190602\_175927, GW190719\_215514, GW190803\_022701, GW190814, GW190828\_063405, GW190828\_065509, and GW190929\_012149 are from analyses using the IMRPhenomXPHM model only. For GW190425, we report results from the high-spin ( $|\vec{\chi}_1| < 0.89$ ) analysis, and since the calculation of the BH remnant properties is only valid for BBH model input those properties are excluded for this BNS signal. A subset of the one-dimensional posterior distributions are visualized in Fig. 8. Two-dimensional projections of the 90% credible regions in the M-q and  $M-\chi_{\rm eff}$  planes are shown in gray in Figs. 4 and 5.

Event	$M~(M_{\odot})$	$\mathcal{M}\;(M_{\odot})$	$m_1~(M_{\odot})$	$m_2~(M_\odot)$	$\chi_{ m eff}$	$D_{\rm L}$ (Gpc)	z	$M_{\rm f}~(M_{\odot})$	$\chi_{\mathrm{f}}$	$\Delta\Omega~(deg^2)$	SNR
GW190408_181802	$43.4^{+4.2}_{-3.0}$	$18.5^{+1.9}_{-1.2}$	$24.8^{+5.4}_{-3.5}$	$18.5^{+3.3}_{-4.0}$	$-0.03^{+0.13}_{-0.17}$	$1.54^{+0.44}_{-0.62}$	$0.29^{+0.07}_{-0.11}$	$41.4^{+3.9}_{-2.9}$	$0.67^{+0.06}_{-0.07}$	290	$14.6^{+0.2}_{-0.3}$
GW190412					$0.21^{+0.12}_{-0.13}$						$19.8^{+0.2}_{-0.3}$
GW190413_052954											$9.0^{+0.4}_{-0.8}$

(Table continued)

TABLE VIII. (Continued)

Event	$M~(M_{\odot})$	$\mathcal{M} \ (M_{\odot})$	$m_1~(M_{\odot})$	$m_2~(M_{\odot})$	$\chi_{ m eff}$	D <sub>L</sub> (Gpc)	z	$M_{\rm f}~(M_{\odot})$	$\chi_{ m f}$	$\Delta\Omega~(deg^2)$	SNR
GW190413_134308	$81.3^{+16.8}_{-11.8}$	$33.3^{+7.8}_{-6.3}$	$51.3^{+16.6}_{-12.6}$	$30.4^{+11.7}_{-12.7}$	$-0.01^{+0.28}_{-0.38}$	$3.80^{+2.48}_{-1.83}$	$0.62^{+0.32}_{-0.26}$	$78.0^{+16.1}_{-11.5}$	$0.68^{+0.12}_{-0.18}$	630	$10.6^{+0.4}_{-0.5}$
GW190421_213856		$31.4^{+6.0}_{-4.6}$	$42.0^{+10.1}_{-7.4}$	$32.0^{+8.3}_{-9.8}$	$-0.10^{+0.21}_{-0.27}$	$2.59^{+1.49}_{-1.24}$	$0.45^{+0.21}_{-0.19}$	$70.5^{+12.4}_{-9.0}$	$0.66^{+0.09}_{-0.12}$	1200	$10.7^{+0.2}_{-0.4}$
GW190425	$3.4^{+0.3}_{-0.1}$	$1.44^{+0.02}_{-0.02}$	$2.1_{-0.4}^{+0.5}$	$1.3^{+0.3}_{-0.2}$	$0.07^{+0.07}_{-0.05}$	$0.15^{+0.08}_{-0.06}$	$0.03^{+0.02}_{-0.01}$			8700	$12.4^{+0.4}_{-0.4}$
GW190503_185404	$69.4^{+10.1}_{-8.6}$	$29.3_{-4.4}^{+4.5}$	$41.3^{+10.3}_{-7.7}$	$28.3^{+7.5}_{-9.2}$	$-0.05^{+0.23}_{-0.30}$	$1.52^{+0.63}_{-0.60}$	$0.29^{+0.10}_{-0.10}$	$66.5^{+9.4}_{-7.9}$	$0.66^{+0.09}_{-0.15}$	100	$12.2^{+0.2}_{-0.4}$
GW190512_180714		$14.6^{+1.4}_{-0.9}$	$23.2^{+5.6}_{-5.6}$	$12.5^{+3.5}_{-2.6}$	$0.02^{+0.13}_{-0.14}$	$1.46^{+0.51}_{-0.59}$	$0.28^{+0.08}_{-0.10}$	$34.3_{-3.4}^{+4.1}$	$0.65^{+0.06}_{-0.07}$	230	$12.7^{+0.3}_{-0.4}$
GW190513_205428	$54.4^{+9.3}_{-6.7}$	$21.8^{+3.8}_{-2.2}$	$36.0^{+10.6}_{-9.7}$	$18.3^{+7.4}_{-4.7}$	$0.16^{+0.29}_{-0.22}$	$2.21^{+0.99}_{-0.81}$	$0.40^{+0.14}_{-0.13}$	$52.1^{+8.8}_{-6.6}$	$0.71^{+0.13}_{-0.13}$	450	$12.5^{+0.3}_{-0.4}$
GW190514_065416		$29.1_{-5.4}^{+8.1}$	$40.9^{+17.3}_{-9.3}$	$28.4^{+10.0}_{-10.1}$	$-0.08^{+0.29}_{-0.35}$	$3.89^{+2.61}_{-2.07}$	$0.64^{+0.33}_{-0.30}$	$66.4^{+19.0}_{-11.5}$	$0.66^{+0.12}_{-0.16}$	3400	$8.0^{+0.3}_{-0.6}$
GW190517_055101	$64.1^{+9.9}_{-9.8}$	$26.5^{+4.0}_{-4.2}$	$39.2^{+13.9}_{-9.2}$	$24.0^{+7.4}_{-7.9}$	$0.49^{+0.21}_{-0.28}$	$1.79^{+1.75}_{-0.88}$	$0.33^{+0.26}_{-0.15}$	$60.1^{+9.9}_{-9.4}$	$0.87^{+0.05}_{-0.07}$	510	$10.8^{+0.5}_{-0.6}$
GW190519_153544		$44.3_{-7.5}^{+6.8}$	$65.1^{+10.8}_{-11.0}$	$40.8^{+11.5}_{-12.7}$	$0.33^{+0.20}_{-0.24}$	$2.60^{+1.72}_{-0.96}$	$0.45^{+0.24}_{-0.15}$	$100.0^{+13.0}_{-12.9}$	$0.79^{+0.07}_{-0.12}$	570	$15.9^{+0.2}_{-0.3}$
GW190521	$153.1^{+42.2}_{-16.2}$	$63.3^{+19.6}_{-14.6}$	$98.4^{+33.6}_{-21.7}$	$57.2^{+27.1}_{-30.1}$	$-0.14^{+0.50}_{-0.45}$	$3.31^{+2.79}_{-1.80}$	$0.56^{+0.36}_{-0.27}$	$147.4^{+40.0}_{-16.0}$	$0.62^{+0.21}_{-0.23}$	1000	$14.3^{+0.5}_{-0.4}$
GW190521_074359	$76.3^{+7.0}_{-5.9}$	$32.8^{+3.2}_{-2.8}$	$43.4^{+5.8}_{-5.5}$	$33.4^{+5.2}_{-6.8}$	$0.10^{+0.13}_{-0.13}$	$1.08^{+0.58}_{-0.53}$	$0.21^{+0.10}_{-0.10}$	$72.6^{+6.5}_{-5.4}$	$0.71^{+0.06}_{-0.06}$	470	$25.9^{+0.1}_{-0.2}$
GW190527_092055	$58.1^{+18.1}_{-8.8}$	$23.9_{-3.9}^{+6.8}$	$35.6^{+18.7}_{-8.0}$	$22.2^{+9.0}_{-8.7}$	$0.10^{+0.22}_{-0.22}$	$2.52^{+2.08}_{-1.23}$	$0.44^{+0.29}_{-0.19}$	$55.5^{+17.9}_{-8.5}$	$0.71^{+0.10}_{-0.16}$	3500	$8.0^{+0.4}_{-0.9}$
GW190602_175927		$48.0^{+9.5}_{-9.7}$	$71.8^{+18.1}_{-14.6}$	$44.8^{+15.5}_{-19.6}$	$0.12^{+0.25}_{-0.28}$	$2.84^{+1.93}_{-1.28}$	$0.49^{+0.26}_{-0.20}$	$110.5^{+17.9}_{-13.9}$	$0.72^{+0.11}_{-0.17}$	740	$13.2^{+0.2}_{-0.3}$
GW190620_030421		$38.1^{+8.5}_{-7.2}$	$58.0^{+19.2}_{-13.3}$	$35.0^{+13.1}_{-14.5}$	$0.34^{+0.22}_{-0.29}$	$2.91^{+1.71}_{-1.32}$	$0.50^{+0.23}_{-0.20}$	$88.0^{+17.2}_{-12.4}$	$0.80^{+0.07}_{-0.15}$	7700	$12.1^{+0.3}_{-0.4}$
GW190630_185205	$59.4_{-4.8}^{+4.7}$	$25.1^{+2.2}_{-2.1}$	$35.1^{+6.5}_{-5.5}$	$24.0^{+5.5}_{-5.2}$	$0.10^{+0.14}_{-0.13}$	$0.87^{+0.53}_{-0.36}$	$0.18^{+0.09}_{-0.07}$	$56.6^{+4.4}_{-4.5}$	$0.70^{+0.06}_{-0.07}$	670	$16.4^{+0.2}_{-0.3}$
GW190701_203306		$40.2^{+5.4}_{-5.0}$	$54.1^{+12.6}_{-8.0}$	$40.5^{+8.7}_{-12.1}$	$-0.08^{+0.23}_{-0.31}$	$2.09^{+0.77}_{-0.74}$	$0.38^{+0.11}_{-0.12}$	$90.2^{+11.2}_{-8.9}$	$0.66^{+0.09}_{-0.13}$	45	$11.2^{+0.2}_{-0.4}$
GW190706_222641		$45.6^{+13.0}_{-9.1}$	$74.0^{+20.1}_{-16.9}$	$39.4^{+18.4}_{-15.4}$	$0.28^{+0.25}_{-0.31}$	$3.63^{+2.60}_{-2.00}$	$0.60^{+0.33}_{-0.29}$	$107.3^{+25.2}_{-15.9}$	$0.78^{+0.09}_{-0.19}$	2600	$13.4^{+0.2}_{-0.4}$
GW190707_093326	$20.1^{+1.7}_{-1.2}$	$8.4^{+0.6}_{-0.4}$	$12.1_{-2.0}^{+2.6}$	$7.9^{+1.6}_{-1.3}$	$-0.04^{+0.10}_{-0.09}$	$0.85^{+0.34}_{-0.40}$	$0.17^{+0.06}_{-0.08}$	$19.2^{+1.7}_{-1.2}$	$0.66^{+0.03}_{-0.03}$	1200	$13.1^{+0.2}_{-0.4}$
GW190708_232457	$31.4^{+2.8}_{-2.2}$	$13.1^{+0.9}_{-0.6}$	$19.8^{+4.3}_{-4.3}$	$11.6^{+3.1}_{-2.0}$	$0.05^{+0.10}_{-0.10}$	$0.93^{+0.31}_{-0.39}$	$0.19^{+0.06}_{-0.07}$	$30.1^{+2.9}_{-2.1}$	$0.68^{+0.04}_{-0.05}$	11000	$13.4^{+0.2}_{-0.3}$
GW190719_215514	$57.2^{+38.4}_{-11.6}$	$22.8^{+8.3}_{-4.3}$	$36.6^{+42.1}_{-11.1}$	$19.9^{+10.0}_{-9.3}$	$0.25^{+0.33}_{-0.32}$	$3.73^{+3.12}_{-2.07}$	$0.61^{+0.39}_{-0.30}$	$54.5^{+38.3}_{-11.1}$	$0.76^{+0.13}_{-0.18}$	3600	$7.9^{+0.3}_{-0.7}$
GW190720_000836	$21.8^{+3.8}_{-2.0}$	$9.0^{+0.4}_{-0.8}$	$14.2^{+5.6}_{-3.3}$	$7.5^{+2.2}_{-1.8}$	$0.19^{+0.14}_{-0.11}$	$0.77^{+0.65}_{-0.26}$	$0.16^{+0.11}_{-0.05}$	$20.8^{+3.9}_{-2.0}$	$0.71^{+0.05}_{-0.05}$	260	$10.9_{-0.8}^{+0.3}$
GW190727_060333	$68.8^{+10.2}_{-7.8}$	$29.4^{+4.6}_{-3.7}$	$38.9^{+8.9}_{-6.0}$	$30.2^{+6.5}_{-8.3}$	$0.09^{+0.25}_{-0.27}$	$3.07^{+1.30}_{-1.23}$	$0.52^{+0.18}_{-0.18}$	$65.4_{-7.3}^{+9.5}$	$0.73^{+0.09}_{-0.11}$	380	$11.7^{+0.2}_{-0.5}$
GW190728_064510	$20.7^{+4.2}_{-1.4}$	$8.6^{+0.6}_{-0.3}$	$12.5^{+6.9}_{-2.3}$	$8.0^{+1.7}_{-2.6}$	$0.13^{+0.19}_{-0.07}$	$0.88^{+0.26}_{-0.38}$	$0.18^{+0.05}_{-0.07}$	$19.7^{+4.4}_{-1.4}$	$0.71^{+0.04}_{-0.04}$	400	$13.1^{+0.3}_{-0.4}$
GW190731_140936	$70.7^{+16.3}_{-11.4}$	$29.7^{+7.4}_{-5.3}$	$41.8^{+12.7}_{-9.1}$	$29.0^{+10.2}_{-9.9}$	$0.07^{+0.28}_{-0.25}$	$3.33^{+2.35}_{-1.77}$	$0.56^{+0.31}_{-0.26}$	$67.4^{+15.3}_{-10.8}$	$0.71^{+0.12}_{-0.14}$	3600	$8.8^{+0.3}_{-0.4}$
GW190803_022701		$27.6^{+5.4}_{-3.8}$	$37.7^{+9.8}_{-6.7}$	$27.6^{+7.6}_{-8.5}$	$-0.01^{+0.23}_{-0.28}$	$3.19^{+1.63}_{-1.47}$	$0.54^{+0.22}_{-0.22}$	$62.1_{-7.6}^{+11.2}$	$0.68^{+0.09}_{-0.12}$	1000	$9.3_{-0.5}^{+0.3}$
GW190814	$25.9^{+1.3}_{-1.3}$	$6.11^{+0.06}_{-0.05}$	$23.3^{+1.4}_{-1.4}$	$2.6^{+0.1}_{-0.1}$	$0.00^{+0.07}_{-0.07}$	$0.23^{+0.04}_{-0.05}$	$0.05^{+0.01}_{-0.01}$	$25.7^{+1.3}_{-1.3}$	$0.28^{+0.03}_{-0.03}$	22	$25.3^{+0.1}_{-0.2}$
GW190828_063405	$57.2^{+7.9}_{-4.3}$	$24.6^{+3.6}_{-2.0}$	$31.9^{+5.4}_{-4.1}$	$25.8^{+4.9}_{-5.3}$	$0.15^{+0.15}_{-0.16}$	$2.07^{+0.65}_{-0.92}$	$0.38^{+0.10}_{-0.15}$	$54.3_{-4.0}^{+7.3}$	$0.74^{+0.07}_{-0.07}$	340	$16.5^{+0.2}_{-0.3}$
GW190828_065509	$34.3^{+5.2}_{-4.3}$	$13.4^{+1.4}_{-1.0}$	$23.7^{+6.8}_{-6.7}$	$10.4^{+3.8}_{-2.2}$	$0.05^{+0.16}_{-0.17}$	$1.54^{+0.69}_{-0.65}$	$0.29^{+0.11}_{-0.11}$	$33.0^{+5.3}_{-4.3}$	$0.64^{+0.08}_{-0.08}$	590	$10.2^{+0.4}_{-0.5}$
GW190910_112807	$78.0^{+9.3}_{-9.1}$	$33.5^{+4.2}_{-4.1}$	$43.8^{+7.6}_{-6.8}$	$34.2^{+6.6}_{-7.3}$	$0.00^{+0.17}_{-0.20}$	$1.52^{+1.09}_{-0.63}$	$0.29^{+0.17}_{-0.11}$	$74.4^{+8.5}_{-8.6}$	$0.69^{+0.07}_{-0.08}$	9600	$14.5^{+0.2}_{-0.3}$
GW190915_235702	$57.2^{+7.1}_{-5.3}$	$24.4^{+3.0}_{-2.3}$	$32.6^{+8.8}_{-4.9}$	$24.5^{+4.9}_{-5.8}$	$-0.03^{+0.19}_{-0.24}$	$1.75^{+0.71}_{-0.65}$	$0.32^{+0.11}_{-0.11}$	$54.7^{+6.6}_{-5.0}$	$0.69^{+0.08}_{-0.09}$	450	$13.1^{+0.2}_{-0.3}$
GW190924_021846	$13.9^{+2.8}_{-0.9}$	$5.8^{+0.2}_{-0.2}$	$8.8^{+4.3}_{-1.8}$	$5.1^{+1.2}_{-1.5}$	$0.03^{+0.20}_{-0.08}$	$0.55^{+0.22}_{-0.22}$	$0.11^{+0.04}_{-0.04}$	$13.3^{+3.0}_{-0.9}$	$0.67^{+0.05}_{-0.04}$	380	$12.0^{+0.3}_{-0.4}$
GW190929_012149	$93.3^{+23.3}_{-15.0}$	$35.6^{+10.2}_{-7.4}$	$66.3^{+21.6}_{-16.6}$	$26.8^{+14.7}_{-10.6}$	$-0.03^{+0.23}_{-0.28}$	$3.13^{+2.51}_{-1.37}$	$0.53^{+0.33}_{-0.20}$	$90.3^{+22.3}_{-14.6}$	$0.60^{+0.17}_{-0.22}$	1700	$9.7^{+0.4}_{-0.6}$
GW190930_133541		$8.5^{+0.5}_{-0.4}$	$14.2^{+8.0}_{-4.0}$	$6.9^{+2.4}_{-2.1}$	$0.19^{+0.22}_{-0.16}$	$0.77^{+0.32}_{-0.32}$	$0.16^{+0.06}_{-0.06}$	$20.2^{+6.1}_{-2.0}$	$0.71^{+0.07}_{-0.06}$	1600	$9.7^{+0.3}_{-0.5}$

one-dimensional marginal posterior distributions shown in Fig. 8. The two-dimensional projections on the M-q and  $\mathcal{M}-\chi_{\rm eff}$  planes are shown as light-gray contours in Figs. 4 and 5 respectively. The full multidimensional posterior distributions are available as part of the public data release accompanying this paper [183], as detailed further in Sec. VII.

Similar to the results presented in Sec. A 1, the vast majority of the inferred source properties for these 36 binaries are consistent with those presented in GWTC-2 [8]. For a subset of binaries, their inferred masses have changed nominally with GW190706\_222641 as of the GWTC-2.1 analysis preferring a higher total mass whereas both GW190521 and GW190929\_012149 now are recovered as less massive than in GWTC-2. Additionally, GW190929\_012149 as recovered in GWTC-2 had a

comparatively broad and multimodal posterior distribution for its primary mass. The higher-mass mode is no longer present in the GWTC-2.1 analysis, which together with the secondary mass of GW190929\_012149 remaining largely unchanged between the GWTC-2 and GWTC-2.1 analyses also leads to larger support for a more equal-mass binary. On the other hand, we now identify GW190707\_093326, GW190708\_232457 and GW190930\_133541 more predominantly with an unequal *q* distribution as compared to the broad support, with stronger preference for equal masses, reported in GWTC-2. Finally, where in GWTC-2 GW190521 was identified with a unimodal *q* posterior distribution, GWTC-2.1 now also supports an additional subdominant mode at more unequal masses.

A more direct comparison between the source properties for the 36 events originally reported in GWTC-2 [8], with

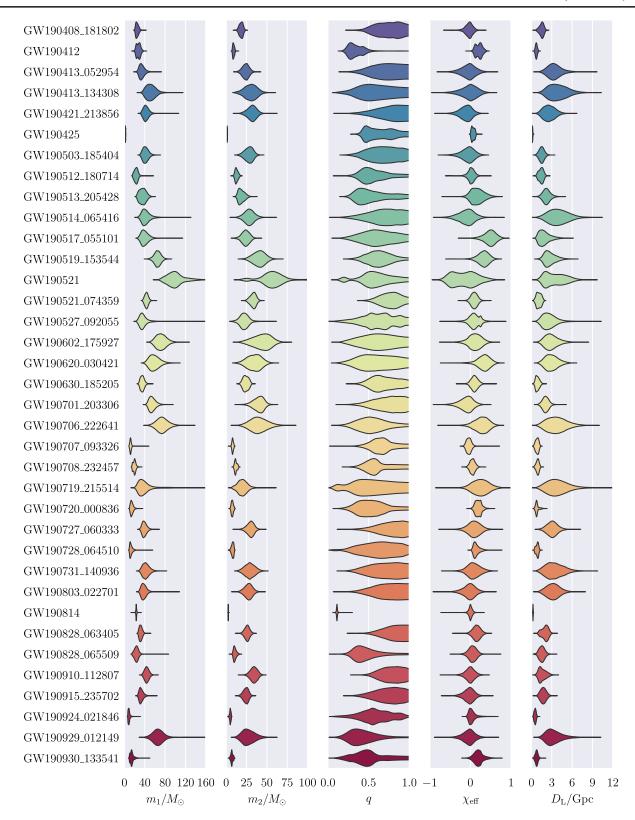


FIG. 8. Marginal posterior distributions on the primary mass  $m_1$ , secondary mass  $m_2$ , mass ratio q, effective inspiral spin  $\chi_{\rm eff}$  and luminosity distance  $D_{\rm L}$  for the 36 events from Table II that were not shown in Fig. 3. The vertical span for each region is constructed to be proportional to the one-dimensional marginal posterior at a given parameter value for the corresponding event. The posterior distributions are also represented numerically in terms of their one-dimensional median and 90% credible intervals in Table VIII.

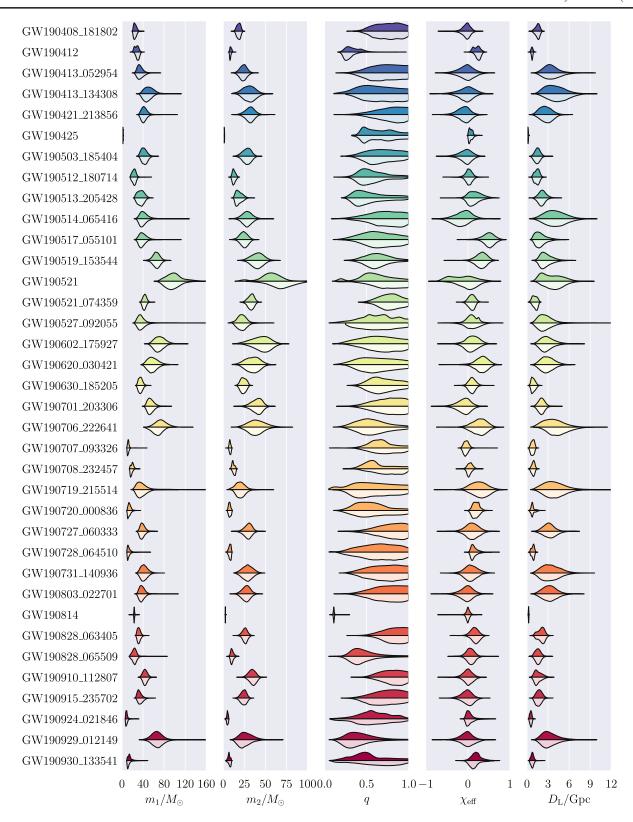


FIG. 9. Marginal posterior distributions of the primary mass  $m_1$ , secondary mass  $m_2$ , mass ratio q, effective inspiral spin  $\chi_{\rm eff}$  and luminosity distance  $D_{\rm L}$  for the 36 events from Table II that were not shown in Fig. 3. The top halves of each distribution match the results also presented in Fig. 8, with the bottom halves representing the analysis from the previous GWTC-2 [8,309]. The vertical span for each region is constructed to be proportional to the one-dimensional marginal posterior at a given parameter value for the corresponding event.

its associated public data release [309], and the analysis presented in this section is presented in Fig. 9. The main differences between the two sets of analyses were already presented in Sec. V, but where it is important to highlight the differing choices of waveform models used. As detailed in Sec. VA, the GWTC-2.1 analysis uses the same two models (IMRPhenomXPHM [57-60] and SEOBNRv4PHM [61–63]) for inferring the source properties of all BBHs whereas GWTC-2 makes use of a much broader set of models with significant variability between the analysis of specific events (the specific waveform model choices are laid out in Sec. VA and Table III of GWTC-2 [8]). These differences make the comparison presented in Fig. 9 more complicated than between two consistent sets of waveforms, but it nonetheless provides a measure for the evolution and improvement of the inference of the source properties of the observed events with the newer and more self-consistent analysis presented in GWTC-2.1 as the preferred results.

Independent results with the IMRPhenomXPHM model for many of these events were previously presented in 3-OGC [17]; other groups have also presented results with either the IMRPhenomXPHM, SEOBNRv4PHM or other precessing higher-mode models for, most prominently, the events GW190412 [310-313] and GW190521 [314-317]. While there is general agreement for the overall inferred source properties from many of these studies, there are significant differences present between them. These differences can however, as also explicitly stated in the studies themselves, be predominantly attributed to different prior assumptions or analysis configurations across the spread of the individual studies, in addition to the variance induced by waveform differences. This further highlights the need for the clear and public dissemination of both the exact analysis configurations used and the generated datasets containing the source properties inferred in order to encourage reproducibility and further model comparisons, especially as more events are added to the population of observed CBCs.

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