

Black hole genealogy: Identifying hierarchical mergers with gravitational waves from binary black holes

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ABSTRACT

In dense stellar environments, the merger products of binary black hole coalescences may proceed through additional mergers with other black holes. These hierarchical mergers are predicted to have higher masses and characteristic spins of ~ 0.7 . However, since the birth properties of black holes are currently uncertain, it is difficult to distinguish systems where components have already undergone prior mergers. We outline an inference scheme that uses a set of gravitational-wave observations to reconstruct the binary black hole mass and spin spectrum of a population containing hierarchical merger events. This inference uses phenomenological models that capture the properties of merging binary black holes from simulations of dense stellar environments, and introduces a zero-spin subpopulation. We apply our population inference to binary black holes from LIGO and Virgo’s first two observing runs, finding that this catalog is consistent with having no hierarchical mergers. GW170729, the most massive system in this catalog, is the most compatible with having a hierarchical merger origin, with an even odds ratio of ~ 0.99 for the binary’s heavier black hole having formed in a merger. Using our model, we find that 99% of first-generation black holes in coalescing binaries have masses below $44 M_{\odot}$, and the fraction of binaries with near-zero spin is $0.64^{+0.27}_{-0.42}$. Further observations of binary black holes will improve constraints on the black hole populations residing in dense stellar environments.

Keywords: Gravitational wave sources — Gravitational wave astronomy — Astrophysical black holes — Hierarchical models

1. INTRODUCTION

The gravitational-wave (GW) observations of LIGO (Aasi et al. 2015) and Virgo (Acernese et al. 2015) have revealed a population of stellar-mass binary black holes (Abbott et al. 2016a, 2019a). These black holes range in mass over $\sim 7\text{--}50M_{\odot}$, extending beyond the spectrum of masses observed in X-ray binaries (Miller & Miller 2014). Since black holes encode information about how their progenitor systems evolve and compact object formation (Abbott et al. 2016b, 2017a; Mandel & Farmer 2018), this new population of black holes observed via GWs has broadened our understanding of the physical processes that shape the mass spectrum of stellar-origin black holes. Already, GW observations hint at a poten-

tial dearth of stellar-mass black holes with component masses $\gtrsim 45M_{\odot}$ (Abbott et al. 2019b).

Black holes are the end point of stellar evolution for stars $\gtrsim 20M_{\odot}$ (Woosley et al. 2002). Though more massive stars typically result in more massive black holes, the mapping between initial stellar mass and remnant mass is strongly impacted by many physical processes, such as stellar winds, stellar rotation, and binary interactions (Belczynski et al. 2010; Spera et al. 2015; Kruckow et al. 2018; Neijssel et al. 2019; Ertl et al. 2019). Additionally, stellar evolution does not predict a simple continuum that persists to arbitrarily-high black hole masses. When stellar cores reach $\sim 50M_{\odot}$ they become susceptible to pair instability (Fowler & Hoyle 1964). In this process, high-energy photons undergo electron–positron pair production, causing a drop in the radiation pressure supporting the stellar core. The core will subsequently contract and increase

in temperature, triggering nuclear burning of carbon, oxygen and silicon (Woosley & Heger 2015). Stellar cores of $\sim 45\text{--}65M_{\odot}$ undergo pulsational pair instabilities (PPIs; Woosley *et al.* 2007; Woosley 2017; Marchant *et al.* 2018), where the star sheds large amounts of mass prior to collapse, limiting the resultant mass of the remnant black hole. Stars of $\gtrsim 65M_{\odot}$ are subject to pair-instability supernovae (PISNe; Barkat *et al.* 1967; Fryer *et al.* 2001; Heger & Woosley 2002), where the instability results in the complete disruption of the star and no remnant black hole. Stellar evolution theory, therefore, predicts a gap in the black hole mass spectrum between $\approx 45\text{--}135M_{\odot}$ (Belczynski *et al.* 2016; Spera & Mapelli 2017; Stevenson *et al.* 2019).

Measuring the bounds of the PPI mass gap will provide insights into stellar evolution and fundamental physics (Farr *et al.* 2019; Farmer *et al.* 2019). However, one needs to account for the dynamical processes that can lead to black holes in this mass range. In dense stellar environments, such as globular clusters and nuclear star clusters, strong gravitational encounters of black holes in the cluster core can harden the orbits of binary black hole systems, facilitating mergers within the cluster (e.g., Hoggie 1975; Banerjee *et al.* 2010; Rodriguez *et al.* 2016a). If these merger products remain in the cluster environment, they can potentially merge again, and be characterized by a higher mass and spin than is typical of black holes at birth (Miller & Hamilton 2002; Gerosa & Berti 2017; Fishbach *et al.* 2017; Kimball *et al.* 2020; Arca Sedda *et al.* 2020). Dense stellar environments are prime locations for facilitating such hierarchical mergers, which exhibit unique intrinsic properties that can be measured with GWs.

Identifying black holes formed through previous mergers requires knowledge of the underlying black hole mass spectrum formed through stellar collapse (Kimball *et al.* 2020; Doctor *et al.* 2019). Given the uncertainties in massive-star evolution and binary stellar evolution, the properties of the natal black hole population is uncertain—it is something we aim to determine from GW observations. Therefore, it is essential to simultaneously infer the properties of the natal black hole population as well as the probability that each binary contains a black hole that is the result of a prior merger; by doing so we can reconstruct valuable information about the origins of binary black holes. For example, the mass spectrum of the natal black hole population contains information on the stellar mass-loss rates (Stevenson *et al.* 2015; Barrett *et al.* 2018). Meanwhile, the fraction of merger products that go on to merge again encodes information on the physics of dense stellar environments. Only a fraction of black holes formed from

binary black hole mergers will be retained within a cluster, since the merger product receives a recoil kick from the anisotropic GW emission (Blanchet 2014; Campanelli *et al.* 2007; Lousto & Zlochower 2011; Spherhake 2015) or can be subsequently ejected through close dynamical interactions with other objects (Hoggie 1975; Portegies Zwart & McMillan 2000; Moody & Sigurdsson 2009; Downing *et al.* 2011). The fraction retained depends on the mass and size of the cluster, and crucially upon the spins of the progenitor black holes (Rodriguez *et al.* 2018, 2019). Furthermore, the number of hierarchical mergers may enable us to determine the dominant formation channel for binary black holes.

In this study, we investigate how hierarchical binary black hole mergers can be identified within a population of GW observations. We focus on formation in globular clusters, where due to the shallow gravitational potential, merger products typically cannot proceed through more than one additional merger before being ejected. We refer to the primordial population of black holes formed from standard stellar evolution as first generation (1G), and black holes that result from a binary black hole merger as second generation (2G). Using simple phenomenological models for the properties of 1G+1G, 1G+2G, and 2G+2G binaries, we perform hierarchical inference to determine the properties and rates of these different sub-populations. These phenomenological models are a natural extension of previous studies of the mass and spin distributions of binary black holes (Fishbach & Holz 2017; Talbot & Thrane 2018; Wysocki *et al.* 2019; Abbott *et al.* 2019b) and are explained in Sec. 2. The hierarchical inference methodology using these models is explained in Sec. 3. We apply our methodology to the set of binary black holes presented in GWTC-1 (Abbott *et al.* 2019a) in Sec. 4, finding that observations are consistent with all binaries being 1G+1G (cf. Kimball *et al.* 2020; Chatziioannou *et al.* 2019; Yang *et al.* 2019). However, if we include the possibility that some 1G black holes are born with near-zero spins (Qin *et al.* 2018; Fuller & Ma 2019), we find approximately equal odds of GW170729 containing a 2G black hole. Our conclusions are summarised in Sec. 5.

2. POPULATION MODEL

Phenomenological models are useful tools for parameterizing black hole population properties and avoiding the computational expenses of simulations of formation environments. The model we develop in this study approximates the detectable population of merging binary black holes from globular clusters, and is designed to capture the main features of binaries formed through

hierarchical mergers in order to illustrate the potential of our inference scheme. This is built using multiple population-level (hyper)-parameters Λ that represent different features of the underlying black hole population, which we will infer from observations.

We assume that the overall population of binary black holes consists of three subpopulations: 1G+1G, 1G+2G and 2G+2G binaries.¹ The fractions that each generation contributes to the total population are defined as $\zeta_{1G+1G}(\Lambda)$, $\zeta_{1G+2G}(\Lambda)$ and $\zeta_{2G+2G}(\Lambda)$ respectively. Since only a small fraction of 2G black holes are retained in the fiducial cluster and able to form a new binary, we expect that $\zeta_{1G+1G}(\Lambda) \gg \zeta_{1G+2G}(\Lambda) \gg \zeta_{2G+2G}(\Lambda)$. By unitarity, we have

$$\zeta_{1G+1G}(\Lambda) + \zeta_{1G+2G}(\Lambda) + \zeta_{2G+2G}(\Lambda) = 1. \quad (1)$$

The fraction of binaries in each subpopulation depends upon the properties of the individual black holes. In particular, their spins and mass ratios have the largest impact on the recoil kick that a merger product receives.

For each generation, we define an astrophysically motivated prior on the properties θ of the binary black holes, such as their masses and spins. We decompose the overall prior for a given generation into priors on the primary mass m_1 , mass ratio $q = m_2/m_1$, spin magnitudes χ_1 and χ_2 , spin orientations z_1 and z_2 , and extrinsic parameters ϑ . The prior on the extrinsic parameters is assumed to be the same for all generations: sources are uniformly distributed in comoving volume, with a comoving merger rate that does not evolve with redshift, and binary orientations uniformly distributed on the sphere. The functional form of the priors on intrinsic parameters are designed to capture the key physics of these populations without being reliant on detailed simulations.

We break down the ingredients of our population model in the following subsections. In Sec. 2.1, we describe a model for the mass and spin distributions of 1G+1G binary black holes (cf. Wysocki et al. 2019; Talbot & Thrane 2018, 2017; Abbott et al. 2019b). The population of 1G+1G binary black holes forms the cornerstone of our models, and the properties of merger products are set based upon this. In Sec. 2.2, we describe our prescription to estimate the mass and spin

distributions of 1G+2G and 2G+2G binaries given the 1G+1G distribution. In Sec. 2.3, we describe a method for calculating the generational fractions ζ_{1G+1G} , ζ_{1G+2G} , and ζ_{2G+2G} given our population model. The hierarchical inference method we outline in Sec. 3 can be adapted to take alternative phenomenological models as improved descriptions are developed. The phenomenological method presented here predicts distributions that are qualitatively similar to simulations of globular clusters (e.g., Rodriguez et al. 2019).

2.1. 1G+1G binaries

2.1.1. Primary mass

Following Abbott et al. (2019b), we model the distribution of 1G+1G black hole primary mass m_1 using the prescription from Talbot & Thrane (2018)

$$\begin{aligned} \pi(m_1 | \alpha, m_{\min}, m_{\max}, \lambda_m, \mu_m, \sigma_m, \mathbf{1G+1G}) = \\ [(1 - \lambda_m) \mathcal{A} m_1^\alpha \Theta(m_{\max} - m_1) + \\ \lambda_m \mathcal{B} \mathcal{N}(m_1 | \mu_m, \sigma_m)], \end{aligned} \quad (2)$$

where $\{\alpha, m_{\min}, m_{\max}, \lambda_m, \mu_m, \sigma_m\} \in \Lambda$ are the population parameters defining this distribution. This model includes two components. The first is a truncated power-law distribution with spectral index α and maximum mass of m_{\max} (enforced by the Heaviside step function Θ). The second is a Gaussian component with mean μ_m and standard σ_m . The parameter λ_m is a mixing fraction, which determines the fraction of binaries associated with either component.

The factors \mathcal{A} and \mathcal{B} are normalisation constants that depend on the other population parameters. This mass distribution is chosen to enforce the expected cut-off in the black hole mass spectrum from PISNe (Heger et al. 2003; Belczynski et al. 2016; Fishbach & Holz 2017), with the Gaussian capturing a build up from PPIs (Woosley 2017; Marchant et al. 2018; Talbot & Thrane 2018).

2.1.2. Mass ratio

Following Abbott et al. (2019b), we model the 1G+1G mass ratio q using a power-law distribution (Talbot & Thrane 2018)

$$\pi(q | m_1, \beta_q, m_{\min}, \mathbf{1G+1G}) = \mathcal{C}(m_1) m_2^\beta \Theta(m_1 - m_2), \quad (3)$$

defined using population parameters $\{m_1, \beta_q, m_{\min}\} \in \Lambda$. Here β is the power-law index, and \mathcal{C} is a normalisation constant.

2.1.3. Spin magnitudes

¹ We neglect the probability of higher-order mergers (containing a $\geq 2G$ component) in this analysis since the number of these mergers are negligible in globular cluster models (Rodriguez et al. 2019; Arca Sedda et al. 2020). However, dense stellar environments such in galactic nuclei, such as nuclear star clusters (Antonini et al. 2019) and active galactic nucleus discs (Yang et al. 2019), may retain higher-order merger products and our approach can be expanded to include their contribution.

We assume that the spin magnitudes of both black holes χ_1 and χ_2 are described by the same distribution,

$$\pi(\chi|\lambda_0, \alpha_\chi, \beta_\chi, 1\text{G}+1\text{G}) = \lambda_0\delta(\chi) + (1 - \lambda_0)\text{B}(\chi|\alpha_\chi, \beta_\chi), \quad (4)$$

described by population parameters $\{\lambda_0, \alpha_\chi, \beta_\chi\} \in \Lambda$. Here, B is a Beta distribution parameterized by shape parameters α_χ and β_χ (Wysocki *et al.* 2019). However, a simple Beta distribution will struggle to capture the morphology of the true population if a significant fraction of binary black holes have low ($\lesssim 0.01$) natal spins, which is anticipated to be the case if angular momentum transport in massive stars is efficient (Qin *et al.* 2018; Fuller & Ma 2019). The mixing parameter λ_0 controls the fraction of black holes merging with negligible spin. We assume that the spin of the primary black hole in a binary is independent from the spin of the secondary black hole.

2.1.4. Spin orientation

The orientation of black hole spin can be parameterized using the cosine of the polar angle between the spin vector and the Newtonian orbital angular momentum $z = \cos\theta_{SL}$. In Abbott *et al.* (2019b), the orientation of black hole spin was modeled using a mixture model (Talbot & Thrane 2017)

$$\pi(z_1, z_2|\zeta_{\text{iso}}, \sigma_1, \sigma_2, 1\text{G}+1\text{G}) = \zeta_{\text{iso}}U(z_1)U(z_2) + (1 - \zeta_{\text{iso}})N_t(z_1|0, \sigma_1)N_t(z_2|0, \sigma_2), \quad (5)$$

defined with population parameters $\{\zeta_{\text{iso}}, \sigma_1, \sigma_2\} \in \Lambda$. Here ζ_{iso} is the fraction of binaries that are drawn from a distribution with isotropic spin orientations (uniform in z_1 and z_2). The isotropic distribution is expected for dynamically-assembled binaries, whose stellar progenitors did not coevolve. Binaries that are not drawn from this uniform distribution U are drawn from a truncated normal distribution N_t . The normal distribution is centered on $z = 0$ corresponding to aligned spin with width determined by the standard deviations σ_1 and σ_2 . The truncated normal distribution represents the binaries formed in the galactic field, where spins are predicted to be generally aligned, with some scatter due to supernova kicks (Rodríguez *et al.* 2016b). For this analysis, we set $\zeta_{\text{iso}} = 1$, which effectively adopts the framework that all binaries are dynamical mergers:

$$\pi(z_1, z_2|\sigma_1, \sigma_2, 1\text{G}+1\text{G}) = U(z_1)U(z_2). \quad (6)$$

For future work, this model could be extended to reintroduce ζ_{iso} and only to consider hierarchical mergers from the fraction of events formed dynamically.

2.2. 1G+2G and 2G+2G binaries

2.2.1. Primary mass

Our model for the primary mass distributions for 1G+2G and 2G+2G mergers is built on the premise that 2G+2G black holes are roughly twice as massive as 1G+1G black holes.² We make the simplifying assumption that in a 1G+2G binary, the primary is always the 2G black hole (cf. Kimball *et al.* 2020). Thus, the 1G+2G and 2G+2G primary mass spectra are modeled as

$$\pi(m_1|\Lambda, 1\text{G}+2\text{G}) \propto \pi\left(\frac{m_1}{2}|\Lambda, 1\text{G}+1\text{G}\right), \quad (7)$$

$$\pi(m_1|\Lambda, 2\text{G}+2\text{G}) \propto \pi\left(\frac{m_1}{2}|\Lambda, 1\text{G}+1\text{G}\right), \quad (8)$$

This representation is found to match the results of globular cluster simulations well (e.g., Rodríguez *et al.* 2018, 2019).

2.2.2. Mass ratio

We expect that 1G+2G and 2G+2G binaries are formed dynamically. Their mass ratio distributions therefore depend upon mass segregation and the dynamical interactions that form binaries inside dense stellar environments. We calibrate our mass ratio distributions against the results of globular cluster simulations from Rodríguez *et al.* (2019).

For 1G+2G binaries, we adopt a model where the mass ratio distribution peaks around $q \sim 0.5$. We find that the distribution recovered from cluster simulations may be approximated as

$$\pi(q|\Lambda, 1\text{G}+2\text{G}) \propto \begin{cases} \pi(q|\Lambda, 1\text{G}+1\text{G})^{1.5} & q \leq 1/2 \\ \pi(1 - q|\Lambda, 1\text{G}+1\text{G})^{-1.5} & q > 1/2 \end{cases}. \quad (9)$$

An alternative parameterization, producing a similar form, is given in Chatziioannou *et al.* (2019). The most important feature of the 1G+2G distribution is that it peaks away from $q = 1$, as this distinguishes it from the 1G+1G and 2G+2G distributions.

For 2G+2G binaries we find that

$$\pi(q|\Lambda, 2\text{G}+2\text{G}) \propto \pi(q|\Lambda, 1\text{G}+1\text{G})^4 \quad (10)$$

produces qualitative agreement with predictions from Rodríguez *et al.* (2019). This distribution is more tightly peaked at $q \sim 1$ than the 1G+1G population, reflecting

² While mass energy is radiated away in GWs so that the remnant mass is a few percent less than the sum of the primary and secondary masses (Reisswig *et al.* 2009; Healy *et al.* 2014; Jiménez-Forteza *et al.* 2017), this is negligible compared to astrophysical modelling uncertainties.

the preference for dynamically-formed binary mergers to be dominated by the most massive components in the cluster (Heggie et al. 1996; Sigurdsson & Phinney 1993; Downing et al. 2011).

2.2.3. Spins

The spin magnitude of post-merger remnants is primarily determined by the orbital angular momentum of the progenitor binary (Pretorius 2005; Buonanno et al. 2008; Gonzalez et al. 2007). For typical binaries—with mass ratio $q \approx 1$ and low spins—the remnant spin is ≈ 0.67 . We therefore adopt for 1G+2G spins

$$\pi(\chi_1|\Lambda, 1\text{G}+2\text{G}) = \text{B}(\chi_1|14.14, 6.97), \quad (11)$$

$$\pi(\chi_2|1\text{G}+2\text{G}) = \pi(\chi_2|\Lambda, 1\text{G}+1\text{G}), \quad (12)$$

and for 2G+2G spins

$$\pi(\chi_1|\Lambda, 2\text{G}+2\text{G}) = \text{B}(\chi_1|14.14, 6.97) \quad (13)$$

$$\pi(\chi_2|\Lambda, 2\text{G}+2\text{G}) = \text{B}(\chi_2|14.14, 6.97). \quad (14)$$

Here, $\text{B}(\mu, \sigma)$ is a beta function with shape parameters α_χ, β_χ , which corresponds to a mean 0.67 and standard deviation 0.1 (cf. Fishbach et al. 2017; Chatziioannou et al. 2019; Arca Sedda et al. 2020).

We assume that the 1G+2G and 2G+2G spins are isotropically oriented, the same as for 1G+1G binaries.

2.3. Retention fraction

Given a 1G+1G population, the branching ratios of the 1G+2G and 2G+2G populations will be determined by the fraction of 1G+1G binaries that are retained in the cluster. During the coalescence of a binary black hole, the anisotropic emission of GWs results in the source receiving a kick as a consequence of conservation of momentum. The magnitude of the GW recoil kicks depends sensitively on the spin and mass ratio of the binary (Gonzalez et al. 2007; Campanelli et al. 2007; Bruegmann et al. 2008; Lousto & Zlochower 2011), and can far exceed the typical escape velocities of globular cluster ($\sim 30\text{--}50 \text{ km s}^{-1}$ at $z = 0$), ejecting merger products and leaving them unavailable to form new generations of binary black holes (Merritt et al. 2004; Moody & Sigurdsson 2009; Varma et al. 2020). Therefore, the branching ratios of the 1G+2G and 2G+2G will be sensitive to the distribution of mass ratios and component spins in the 1G+1G population, as well as the mass and size of the cluster.

We begin by calculating the probability $P_{\text{ret}}(\chi_1, \chi_2, q)$ that the remnant of a merging binary with component spins and mass ratio (χ_1, χ_2, q) will be retained in a nominal cluster potential following the GW recoil kick. As a

model cluster, we adopt a Plummer potential (Plummer 1911) with mass distribution

$$\rho_p(r) = \frac{3M_c}{4\pi r_c^3} \left(1 + \frac{r^2}{a_c^2}\right)^{-5/2}. \quad (15)$$

We assume a cluster mass $M_c = 5 \times 10^5 M_\odot$ and a Plummer radius $r_c = 1 \text{ pc}$ to represent a fiducial globular cluster. For a given $\{\chi_1, \chi_2, q\}$ we sample merger locations following Eq. (15) and sample component spin-tilts isotropically, then calculate recoil velocities according to Gerosa & Kesden (2016) and check against the local escape velocity to obtain $P_{\text{ret}}(\chi_1, \chi_2, q)$.

Figure 1 shows $P_{\text{ret}}(\chi_1, \chi_2, q)$ for the case of equal spins. P_{ret} is negligible when component spins are $\gtrsim 0.1$, except in the regime of extreme mass ratios ($q \rightarrow 0$) where recoil velocities disappear. Therefore, nearly all 1G+1G binaries with appreciable spins will form merger products that are immediately ejected from the fiducial cluster and will be unable to form hierarchical mergers. The availability of 1G+1G remnants able to contribute toward 1G+2G and 2G+2G binaries is consequently highly sensitive to the details of the mass ratio and spin distributions of the 1G+1G population.

For a population determined by population parameters Λ , we can calculate the fraction F_{ret} of 1G+1G remnants that are retained in our fiducial cluster as

$$F_{\text{ret}}(\Lambda) = \int dq \int d\chi_1 \int d\chi_2 \pi(\chi_1|\Lambda, 1\text{G}+1\text{G}) \pi(\chi_2|\Lambda, 1\text{G}+1\text{G}) \pi(q|\Lambda, 1\text{G}+1\text{G}) P_{\text{ret}}(\chi_1, \chi_2, q). \quad (16)$$

Here, $\pi(q|\Lambda, 1\text{G}+1\text{G})$ and $\pi(\chi|\Lambda, 1\text{G}+1\text{G})$ are the 1G+1G mass ratio and component spin distributions.

2.4. Branching ratios

Using $F_{\text{ret}}(\Lambda)$, we calculate hierarchical branching ratios given a 1G+1G population with mass and spin distributions determined by population parameters Λ . Let $R_{1\text{G}+1\text{G}}$, $R_{1\text{G}+2\text{G}}$, and $R_{2\text{G}+2\text{G}}$ be the rates of 1G+1G, 1G+2G, and 2G+2G mergers, respectively, averaged over the lifetime of the cluster. The number of 2G black holes available to form new binaries is proportional to $F_{\text{ret}}R_{1\text{G}+1\text{G}}$. Therefore, we expect

$$R_{1\text{G}+2\text{G}} = \xi_{1\text{G}+2\text{G}} F_{\text{ret}}(\Lambda) R_{1\text{G}+1\text{G}}, \quad (17)$$

$$R_{2\text{G}+2\text{G}} = \xi_{2\text{G}+2\text{G}} [F_{\text{ret}}(\Lambda)]^2 R_{1\text{G}+1\text{G}}, \quad (18)$$

where the constants of proportionality $\xi_{1\text{G}+2\text{G}}$ and $\xi_{2\text{G}+2\text{G}}$ are set by the dynamical processes within the cluster, such as the frequency at which binaries form. Based on comparison with simulations (Rodriguez et al. 2019), we find that $\xi_{1\text{G}+2\text{G}} \simeq 1/2$ and $\xi_{2\text{G}+2\text{G}} \simeq 1/8$ are good

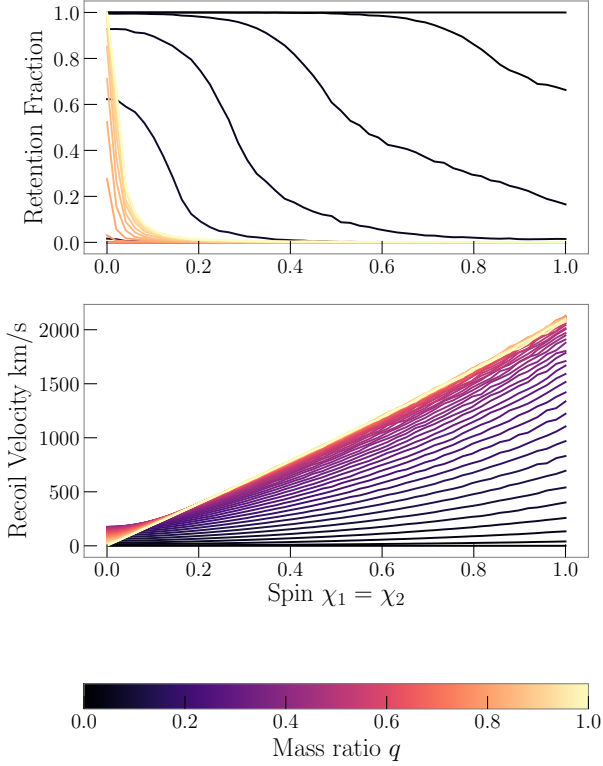


Figure 1. *Bottom:* Recoil velocities for equal component-spin binary black holes, shaded according to mass ratio q . For each $\{\chi, q\}$ configuration, we sample spin orientations isotropically and plot the mean recoil velocity. *Top:* The associated retention fractions P_{ret} assuming a $5 \times 10^5 M_\odot$ cluster with a 1 pc Plummer radius.

approximations. From the rates we can define branching ratios,

$$\Gamma_{1G+2G} \equiv \frac{R_{1G+2G}}{R_{1G+1G}} = \xi_{1G+2G} F_{ret}(\Lambda), \quad (19)$$

$$\Gamma_{2G+2G} \equiv \frac{R_{2G+2G}}{R_{1G+1G}} = \xi_{2G+2G} [F_{ret}(\Lambda)]^2. \quad (20)$$

Since F_{ret} is small, we have $\Gamma_{2G+2G} \ll \Gamma_{1G+2G} \ll 1$.

We combine these branching ratios with our individual 1G+1G, 1G+2G, and 2G+2G population distributions to construct a multigenerational mixture model:

$$\begin{aligned} \pi_{hier}(\theta|\Lambda) &= \zeta_{1G+1G}(\Lambda)\pi(\theta|\Lambda, 1G+1G) \\ &+ \zeta_{1G+2G}(\Lambda)\pi(\theta|\Lambda, 1G+2G) \\ &+ \zeta_{2G+2G}(\Lambda)\pi(\theta|\Lambda, 2G+2G), \end{aligned} \quad (21)$$

where

$$\zeta_{1G+1G} = \frac{1}{1 + \Gamma_{1G+2G} + \Gamma_{2G+2G}}, \quad (22)$$

$$\zeta_{1G+2G} = \frac{\Gamma_{1G+2G}}{1 + \Gamma_{1G+2G} + \Gamma_{2G+2G}}, \quad (23)$$

$$\zeta_{2G+2G} = \frac{\Gamma_{2G+2G}}{1 + \Gamma_{1G+2G} + \Gamma_{2G+2G}}. \quad (24)$$

We will apply this to the catalogue of GW observations to infer the population parameters Λ , and then evaluate the odds that any of the observations are from a hierarchical merger.

In addition to this full multigenerational model with mass and spin distributions as described in Sec. 2.1 and Sec. 2.2, we also consider population models without the 1G+1G zero-spin component.

3. POPULATION INFERENCE

Using the population models described in Sec. 2 we model the population of observations. Given a set of population parameters Λ , the overall likelihood of an observation is

$$\mathcal{L}_{hier}(d_i|\Lambda) = \frac{1}{P_{det}(\Lambda)} \int d\theta L(d_i|\theta)\pi_{hier}(\theta|\Lambda), \quad (25)$$

where we use d_i to denote the GW data associated with the i -th observation, $L(d_i|\theta)$ is the likelihood of the data given the source parameters θ (Cutler & Flanagan 1994; Abbott et al. 2016c), $\pi_{hier}(\theta|\Lambda)$ is the population model defined in Sec. 2, and $P_{det}(\Lambda)$ is the fraction of all astrophysical events which are observed and accounts for selection biases (Thrane & Talbot 2019). The fraction $P_{det}(\Lambda)$ scales as the surveyed space-time volume $VT(\Lambda)$ of the detector network for a binary black hole population with population parameters Λ ; we calculate $VT(\Lambda)$ analytically following Finn & Chernoff (1993), using a single-detector network with a median (over O1 and O2 observing times) Hanford noise curve and signal-to-noise ratio threshold of 8. The overall likelihood in Eq. (25) can equivalently be written by breaking it up into pieces for each generation,

$$\begin{aligned} \mathcal{L}_{hier}(d_i|\Lambda) &= \frac{1}{P_{det}(\Lambda)} [\zeta_{1G+1G}(\Lambda)\mathcal{L}(d_i|\Lambda, 1G+1G) \\ &+ \zeta_{1G+2G}(\Lambda)\mathcal{L}(d_i|\Lambda, 1G+2G) \\ &+ \zeta_{2G+2G}(\Lambda)\mathcal{L}(d_i|\Lambda, 2G+2G)], \end{aligned} \quad (26)$$

where

$$\mathcal{L}(d_i|\Lambda, 1G+1G) = \int d\theta L(d_i|\theta)\pi(\theta|\Lambda, 1G+1G), \quad (27)$$

and likelihoods for the other generations are defined similarly.

For a set of N detections (described by data \vec{d}), the total likelihood becomes

$$\mathcal{L}_{\text{tot}}(\vec{d}|\Lambda) = \prod_i^N \mathcal{L}_{\text{hier}}(d_i|\Lambda). \quad (28)$$

To calculate the total likelihood, we use a set of samples drawn from the parameter posterior probability distributions

$$p(\theta|d_i) = \frac{L(d_i|\theta)\pi(\theta|\varnothing)}{Z_{\varnothing}(d_i)}, \quad (29)$$

calculated for each event using some fiducial parameter prior distribution $\pi(\theta|\varnothing)$ which does not depend on the population parameters. Taking n_i parameter posterior samples for the i -th event,

$$\mathcal{L}_{\text{tot}}(\vec{d}|\Lambda) \simeq \prod_i^N \frac{1}{P_{\text{det}}(\Lambda)} \frac{Z_{\varnothing}(d_i)}{n_i} \sum_k^{n_i} \frac{\pi(\theta^k|\Lambda)}{\pi(\theta^k|\varnothing)}, \quad (30)$$

where θ^k indicates the parameters of the k -th sample (Thrane & Talbot 2019).

In the case where our 1G+1G spin distribution includes the delta-function at 0, we alter this approach to account for the lack of parameter estimation samples with precisely zero component spin. For each event, we produce posterior samples with two fiducial priors (which are identical except for the component spins): one uniform in spin magnitude $\pi_{\chi}(\theta|\varnothing)$, which enables us to sample the entire range of spins, and one where the spin is always zero $\pi_0(\theta|\varnothing)$, which is applicable to the delta-function model. In this case, the 1G+1G term in Eq. (30) becomes

$$\mathcal{L}(d_i|\Lambda, 1\text{G}+1\text{G}) \simeq \frac{1}{n_i} \left[\lambda_0 \sum_j^{n_{i,0}} \frac{\pi(\theta^j|\Lambda, 1\text{G}+1\text{G})}{\pi_0(\theta^j|\varnothing)} + (1 - \lambda_0) \sum_k^{n_{i,\chi}} \frac{\pi(\theta^k|\Lambda, 1\text{G}+1\text{G})}{\pi_{\chi}(\theta^k|\varnothing)} \right]. \quad (31)$$

Here, $n_{i,0}$ and $n_{i,\chi}$ are the number of samples included using the zero-spin and uniform-spin respectively, and $n_i = n_{i,0} + n_{i,\chi}$ is the total number of samples used; the ratio of the number of zero- and uniform-spin samples is the ratio of the evidences calculated with the two priors,

$$\frac{n_{i,0}}{n_{i,\chi}} = \frac{Z_0(d_i)}{Z_{\chi}(d_i)} = \frac{\int d\theta L(d_i|\theta)\pi_0(\theta|\varnothing)}{\int d\theta L(d_i|\theta)\pi_{\chi}(\theta|\varnothing)}. \quad (32)$$

This procedure allows us to calculate the population likelihood even though the delta-function and Beta distribution components of the spin model from Eq. (4) have different ranges of support.

We use hierarchical Bayesian inference to construct a posterior for our population parameters

$$p(\Lambda|\vec{d}) = \frac{\mathcal{L}_{\text{hier}}(\vec{d}|\Lambda)\pi(\Lambda)}{\int d\Lambda \mathcal{L}_{\text{hier}}(\vec{d}|\Lambda)\pi(\Lambda)}, \quad (33)$$

where $\pi(\Lambda)$ is our prior on our population parameters. With the exception of m_{max} , we take this prior to be flat (Abbott et al. 2019b); to account for uncertainties in the location of the PISN mass gap inherent in different sets of assumptions about nuclear reaction rates, stellar rotation, and fallback (Farmer et al. 2019; Mapelli et al. 2019), we take a Gaussian prior on m_{max} with a mean of $50M_{\odot}$ and standard deviation of $10M_{\odot}$.

We use GWPOPULATION (Talbot et al. 2019) and DYNESTY (Speagle 2019) within the BILBY framework (Ashton et al. 2019) to sample the likelihoods in Eq. (28) and Eq. (31). Gravitational-wave data from LIGO and Virgo is obtained from the Gravitational Wave Open Science Center (Abbott et al. 2019c).

4. APPLICATION TO GWTC-1

4.1. Inferred Populations

We apply the above analysis using the 10 binary black hole observations contained in GWTC-1 (Abbott et al. 2019a), and infer population parameters for our hierarchical model. We plot the posterior predictive distributions for the 1G+1G, 1G+2G, and 2G+2G populations in Fig. 2 and Fig. 3. The population parameters governing the 1G+1G mass distribution (see Fig. 2 in the Appendix) are consistent with the results in Abbott et al. (2019b). The Gaussian mass component corresponding to PPI build-up is well constrained to $\mu_m \simeq 25\text{--}33M_{\odot}$, but we recover our prior on the location of the PISN maximum-mass cutoff m_{max} . We find that 99% of 1G+1G black holes are less than $44M_{\odot}$, in agreement with $45M_{\odot}$ found in Abbott et al. (2019b). We find that 99% of black holes in the combined multigeneration population are less than $72M_{\odot}$.

In Fig. 11 of the Appendix, we show population parameters for the 1G+1G spin distribution.

The fraction λ_0 of black holes from the zero-spin formation channel is constrained to be less than 0.91 at the 99% credible level, and is consistent with $\lambda_0 = 0$. Therefore, these GW observations suggest that at least some 1G+1G binary black holes have spinning components (Miller et al. 2020), and not all 1G black holes have low (< 0.01) spins as would be expected if all progenitor stars had efficient angular momentum transfer (Fuller & Ma 2019). We find that 90% of 1G+1G primary black holes have a spin magnitude less than 0.57.

In the bottom panel of Figure 4, we reweight the GWTC-1 mass posteriors to apply our inferred hierar-

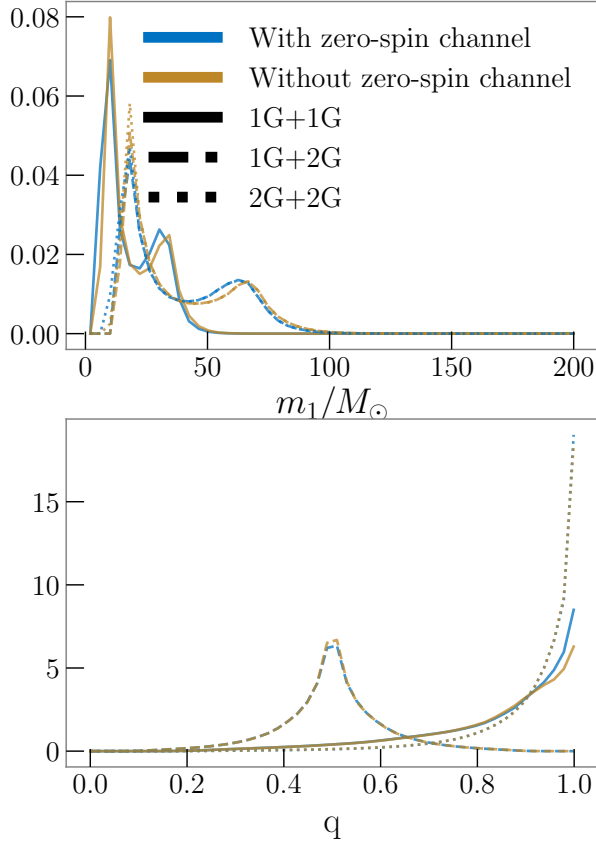


Figure 2. Posterior predictive distributions for primary mass m_1 and mass ratio q . The solid, dashed, and dotted lines are the 1G+1G, 1G+2G, 2G+2G distributions, respectively. The 1G+2G and 2G+2G primary masses are drawn from the same distributions. In blue, we plot the distributions inferred when allowing for the zero-spin formation channel, and the distributions inferred when excluding this channel are plotted in orange.

chical population model as a prior: the primary effect acts to constrain the mass ratio compared to the fiducial prior used in the initial parameter inference. Upon reweighting, the 90% credible interval on the primary black hole mass for GW170729 becomes 36–66 M_\odot , compared to 40–66 M_\odot with the default prior (Abbott et al. 2019a).

4.2. Relative merger rates

As shown in Fig. 5, we find that the relative rates Γ_{1G+2G} and Γ_{2G+2G} are strongly correlated with the fraction λ_0 of 1G black holes that form in the zero-spin channel. These branching ratios are set by the fraction of 1G+1G merger products that are retained in a typical cluster. Since merging binaries with non-spinning components experience lower recoil velocities than those with non-negligible spin, the inclusion of the zero-spin

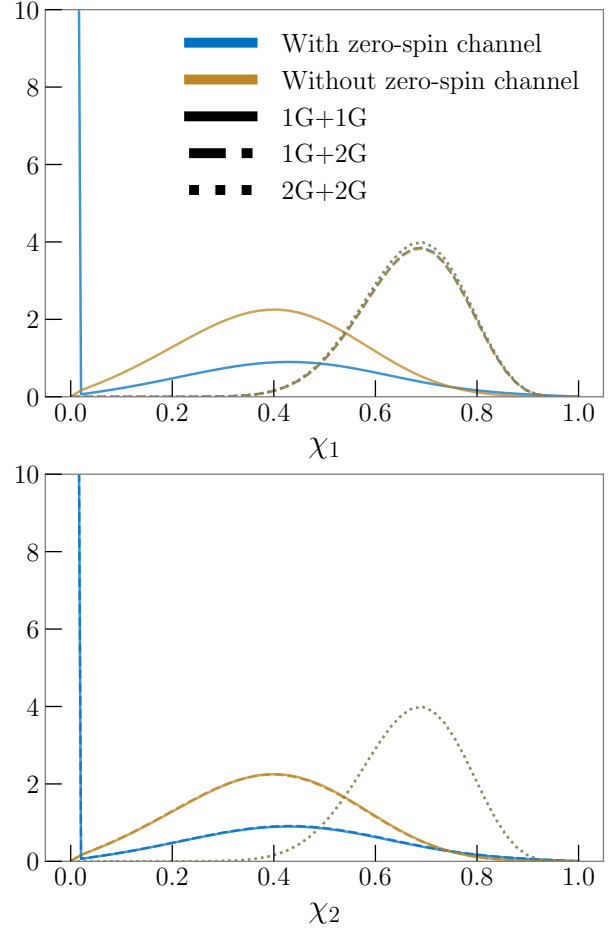


Figure 3. Posterior predictive distributions for the component black hole spins. The solid, dashed, and dotted lines are the 1G+1G, 1G+2G, 2G+2G distributions, respectively. The 1G+2G and 2G+2G primary spins are drawn from the same distributions, as are the 1G+1G and 1G+2G secondary spins. In blue, we plot the distributions inferred when allowing for the zero-spin formation channel, and distributions inferred when excluding this channel are plotted in orange.

formation channel drastically affects the retention fraction, and consequently the branching ratios.

We find the median relative rates Γ_{1G+2G} and Γ_{2G+2G} to be 0.15 and 0.03, respectively, with 99% upper limits of 0.34 and 0.06. Adopting a fiducial binary black hole merger rate of $\sim 50 \text{ Gpc}^{-3} \text{ yr}^{-1}$ (Abbott et al. 2019b) as a 1G+1G merger rate, (we have not explicitly inferred the rate as part of our model) these 99% upper limits would imply merger rates at $\lesssim 18 \text{ Gpc}^{-3} \text{ yr}^{-1}$ and $\lesssim 3 \text{ Gpc}^{-3} \text{ yr}^{-1}$ respectively.

Rerunning our analysis without the zero-spin subcomponent, the median branching ratios Γ_{1G+2G} and Γ_{2G+2G} become 2.2×10^{-3} and 3.3×10^{-6} respectively, with 99% upper limits of 9.2×10^{-3} and 4.2×10^{-5} , respectively.

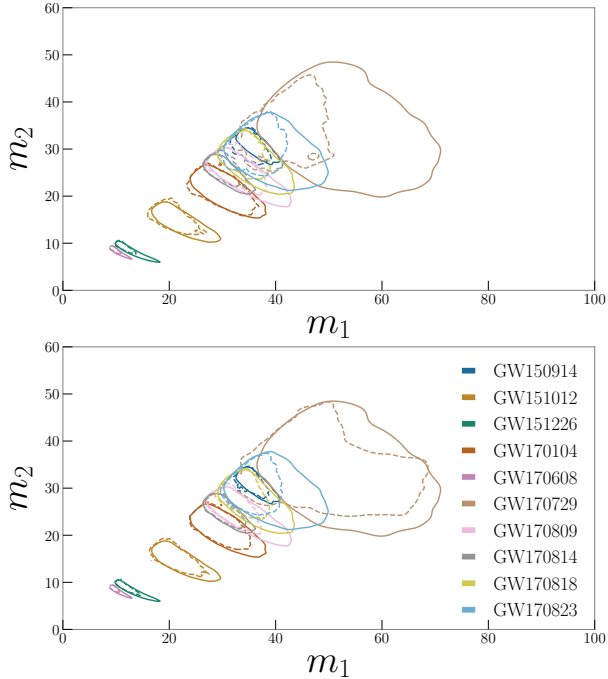


Figure 4. Reweighted GWTC-1 mass posteriors using our inferred hierarchical population model as a prior. Contours indicate the 90% credible areas. The original posteriors from Abbott et al. (2019a) are indicated with solid lines, and the reweighted posteriors in dashed lines. *Bottom:* Results reweighted using the population model inferred when allowing for the zero-spin formation channel. *Top:* Results reweighted using the model inferred when excluding this the zero-spin channel.

As the rates are much lower, we are less likely to observe hierarchical mergers than when there are black holes with effectively zero spin. The sensitivity of the merger rates on spin could potentially enable us to place tight constraints on the spins of 1G black holes — which are difficult to measure directly from GW observations (Poisson & Will 1995; Pürrer et al. 2016; Vitale et al. 2014; Abbott et al. 2019a) — through the constraints on the hierarchical merger rate.

The lower branching ratios inferred when excluding the zero-spin formation channel affect shape of the overall multigenerational population, with little support for primary masses in the PPI mass gap. In the top panel of Fig. 4, we plot the re-weighted component mass posterior samples for the 10 events in GWTC-1, with the population model excluding the zero-spin component as a prior. The reduced hierarchical merger rates lead to smaller support for masses above the upper mass cutoff, and the 90% interval on the primary black hole mass for GW170729 tightens to $35\text{--}50M_{\odot}$. Without the zero-spin population subcomponent, the 90% upper limit on 1G+1G primary black hole spin magnitude becomes

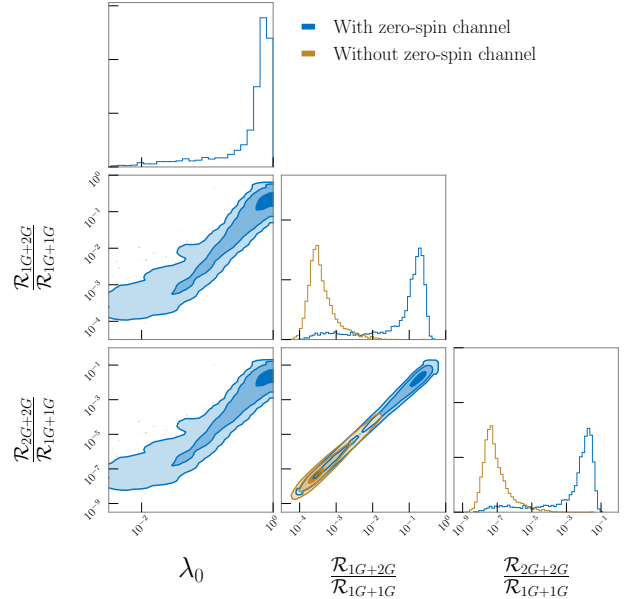


Figure 5. Posteriors of the inferred branching ratios, which are the relative 1G+2G versus 1G+1G and 2G+2G versus 1G+1G merger rates, and the fraction of 1G+1G binary black holes with zero-spin λ_0 . In blue we plot the results when we allow for the zero-spin formation channel, and in orange, we plot the results when excluding the zero-spin formation channel (fixing $\lambda_0 = 0$).

0.61, in agreement with the 0.6 upper limit reported in Abbott et al. (2019b).

The inferred branching ratios are consistent with Monte Carlo modeling of binary black hole populations in globular clusters; in the most extreme case where all black holes are assumed to be born with zero spin, such modeling predicts $\approx 13\%$ (1%) of merging binary black holes are 1G+2G (2G+2G) systems (Rodríguez et al. 2019). As the natal spins of black holes increase, the retention fractions and relative rates will precipitously drop as the recoil kicks become stronger. Rodríguez et al. (2019) find that if black hole natal spins are assumed to be $\chi = 0.5$, that the number of black holes with a 2G component drops to $\lesssim 1\%$ of the total population.

4.3. Odds ratios for the hierarchical merger scenario

With our multigenerational model, we also can calculate the odds ratio \mathcal{O} that a given binary black hole came from a hierarchical mergers verses from a 1G+1G system. If the parameter distributions of each generational subpopulation we known, the the odds ratio that the i -th observation came from a 1G+2G system versus

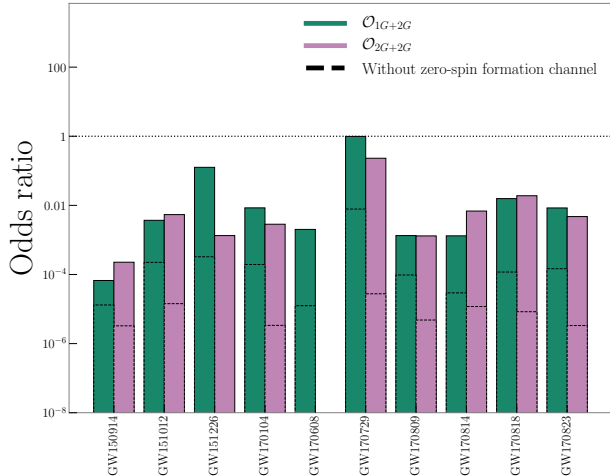


Figure 6. Odds ratios for each of the GWTC-1 events being of hierarchical versus 1G+1G origin. The odds for 1G+2G origin are plotted in green, while the odds for 2G+2G origin are in pink. The dashed lines indicate the odds when we use the model inferred when excluding the zero-spin channel. The dotted line indicates even odds.

a 1G+1G system would be

$$\begin{aligned} \mathcal{O}_{1G+2G}^i &\equiv \frac{P(1G+2G|d_i)}{P(1G+1G|d_i)} \\ &= \frac{Z(d_i|1G+2G) P(1G+2G)}{Z(d_i|1G+1G) P(1G+1G)}, \end{aligned} \quad (34)$$

where the first term in Eq. (34) is the ratio of evidences for the observation given the 1G+2G and 1G+1G subpopulations (a Bayes factor; Kimball *et al.* 2020), and the second term is the prior odds (relative rates) of mergers of the two generations. However, as we do not know the exact form of the underlying population, our uncertainty in the population parameters affects both the relative rates and the ratio of evidences. This can be quantified by integrating over the population parameters and weighting by our posterior probability distribution $p(\Lambda|\vec{d})$, which gives the estimate for the odds ratio

$$\mathcal{O}_{1G+2G}^i = \frac{\int d\Lambda Z(d_i|\Lambda, 1G+2G) \zeta_{1G+2G}(\Lambda) p(\Lambda|\vec{d})}{\int d\Lambda Z(d_i|\Lambda, 1G+1G) \zeta_{1G+1G}(\Lambda) p(\Lambda|\vec{d})}, \quad (35)$$

where the evidence for the 1G+2G population is

$$Z(d_i|\Lambda, 1G+2G) = \int d\theta L(d_i|\theta) \pi(\theta|\Lambda, 1G+2G), \quad (36)$$

the 1G+1G evidence $Z(d_i|\Lambda, 1G+1G)$ is defined similarly, and ζ_{1G+2G} and ζ_{1G+1G} encode the relative rates. The odds ratio for a 2G+2G system versus a 1G+1G system \mathcal{O}_{2G+2G}^i can be calculated by swapping 1G+2G to 2G+2G in Eq. (35).

We calculate these odds ratios for all 10 events in GWTC-1 (Abbott *et al.* 2019a), and plot the results

in Figure 6. For GW170729, the event with the most massive primary black hole, we find approximately even odds that the system is of 1G+2G versus 1G+1G origin when the zero-spin component is implemented in our models, while the overall probability that GW170729 is of hierarchical origin (either 1G+2G or 2G+2G) is 0.55. Across all 10 systems in GWTC-1, we find the probability that at least one binary black hole system is of hierarchical origin is 0.63. As the inferred branching ratios are much smaller when excluding the zero-spin formation channel, the odds ratios for hierarchical origin, shown in dashed lines in Fig. 6, are reduced by a factor of $\approx 10^2$. While we find it equally likely that GW170729 is of 1G+2G or 1G+1G origin when including the zero-spin subcomponent, excluding it leads us to conclude that GW170729 is most likely of 1G+1G origin by a factor of 130:1, and that the probability of at least one event being of hierarchical origin is 0.009.

To check how our prior on m_{\max} affects our results we rerun the analysis with a uniform prior between $20M_{\odot}$ and $200M_{\odot}$. While we infer a peak in the posterior on m_{\max} near $40M_{\odot}$, we find support all the way out to $200M_{\odot}$ well above any of the GWTC-1 black hole masses, indicating that we are insensitive to the existence of the mass gap (discussed further in the Appendix). We expect that the odds ratio in favor of an event being a hierarchical merger will depend upon the value of m_{\max} : if a system is observed with masses confidently above this, then the system must be a hierarchical merger. In Fig. 7, we show how the odds ratios change for GW170729 as we change the maximum allowed prior value of m_{\max} . Extending the prior above $\sim 70M_{\odot}$ has little impact on the results. The odds ratio in favor of a hierarchical merger increases as m_{\max} cuts through the range of masses with posterior support for GW170729's primary mass. The increase in the odds ratio is not large, as m_{\max} only governs the power-law component of the mass distribution, and when we get to $\sim 40M_{\odot}$ we start to get sufficient support from from the Gaussian component to explain the observed masses. These results show that our conclusions are not particularly sensitive to the location (or existence of) the PISN mass gap. We expect that assumed range for m_{\max} would be more important if a more massive binary is observed, such that we must either extend the 1G mass distribution into the mass gap or (within the framework of our analysis) conclude that we have seen a hierarchical merger.

5. CONCLUSIONS

GW observations have demonstrated that binary black holes merge to form more massive black holes

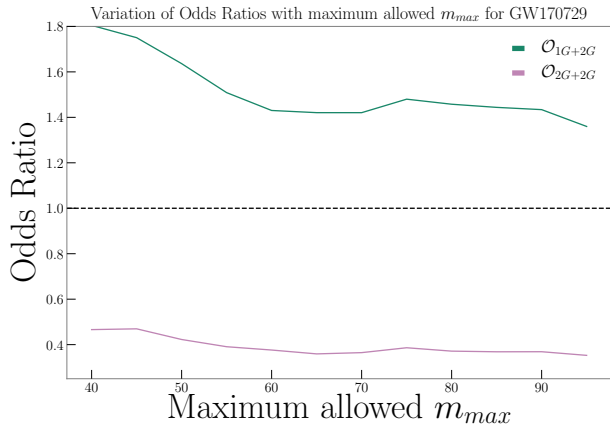


Figure 7. Odds ratios for GW170729 being of hierarchical versus 1G+1G origin as a function of the maximum allowed value of the upper mass cutoff m_{max} . The odds in favor of 1G+2G origin are plotted in green, and the odds in favor of 2G+2G origin are in pink. Here we assume a flat prior on m_{max} from 20–200 M_{\odot} and make successive cuts while calculating the odds ratios. The gray shaded region indicates the 90% confidence interval on GW170729’s primary binary mass assuming the fiducial parameter estimation prior (Abbott et al. 2019a).

(Abbott et al. 2016a). If these merger products form a new binary, they may again become a GW source. The complete catalogue of GW sources may therefore contain a mixture of 1G black holes formed from stellar collapse, and 2G black holes formed in mergers. In using the population of GW sources to infer the formation mechanisms for black holes, for example if their progenitors are subject to PPI, it is necessary to account for the potential presence of 2G black holes, to prevent our conclusions being biased; however, it is difficult to concretely distinguish 1G and 2G black holes as the populations overlap in properties. We outline an analysis that self-consistently infers both the fraction of binaries containing 2G black holes, and the fundamental properties of the population of 1G+1G binaries.

Our analysis uses phenomenological models to describe the binary black hole population. The models are calibrated to reproduce the features seen in simulations of globular clusters (Rodríguez et al. 2019). The fraction of 2G black hole that are retained in a cluster following a merger depends sensitively upon the spins of 1G black holes, as larger spins results in larger GW recoil kicks. Simulations of massive stars with efficient angular momentum transfer predict that black holes would form with spins $\lesssim 0.01$ (Fuller & Ma 2019). Therefore, our population model also includes the possibility of a fraction of 1G black holes that have effectively zero spin.

We apply our approach to the 10 binary black holes found by LIGO and Virgo in their first two observing runs (Abbott et al. 2019a). We find that:

1. The 1G+1G population is fit by a steep power-law with exponent $\alpha > 1.3$ plus a Gaussian component with mean $\mu_m = 30.4^{+3.6}_{-4.9} M_{\odot}$. We find an upper cut-off to the power-law of $47^{+11}_{-9} M_{\odot}$, but this is dominated by our choice of prior. Across the multigenerational population, we find that 99% of black holes in binaries have masses $m_1 \lesssim 72 M_{\odot}$. Overall, the 1G+1G population is consistent with the mass distributions inferred in Abbott et al. (2019b).
2. The fraction of 1G+1G binaries with zero spin is $\lambda_0 < 0.91$ with 99% probability, and 90% of 1G+1G primary black holes have spins less than 0.57. Excluding the zero-spin formation channel, 90% of 1G+1G black holes have spins less than 0.61.
3. The median merger rates of 1G+2G and 2G+2G binaries relative to 1G+1G binaries are inferred to be 0.15 and 0.03, respectively, with 99% upper limits of 0.34 and 0.06. The relative rates are tightly correlated with the fraction of 1G black holes with zero spin. Excluding the zero-spin subcomponent of our spin distribution, the relative rates drop to 2.2×10^{-3} and 3.3×10^{-6} respectively, with 99% upper limits of 9.2×10^{-3} and 4.2×10^{-5} . Since the relative rates and spins are tightly linked, a measurement of one would pin down the other.
4. The 10 binary black holes from GWTC-1 are all consistent with being 1G+1G. Given the rarity of 1G+2G and 2G+2G mergers, this is not surprising. The source of GW170729, which is the most massive of the observed systems, has the greatest probability of being the result of a hierarchical merger. There are approximately equal odds of it being a 1G+1G or a 1G+2G merger (when including the zero-spin subcomponent of our spin population model). While this result is sensitive to the assumed spin distribution, it is not especially sensitive to the allowed range for m_{max} , as the masses for GW170729 are consistent with being below the PISN gap.

We cannot make a definite conclusion about the presence of hierarchical mergers amongst this catalogue of 10 events, but our probabilistic approach to measuring the distribution of binary black holes means that this uncertainty is folded into our calculations.

The analysis is currently limited to considering binary black holes formed in globular clusters. In reality, we expect that binary black holes will form in several environments. Those forming as isolated binaries in the field would be unlikely to go on to form a hierarchical merger. On the other hand, those formed in a nuclear star cluster are much more likely to be retained and available to form hierarchical mergers due to their higher escape velocities (Antonini & Rasio 2016; Antonini *et al.* 2019; Yang *et al.* 2019). Including alternative channels is necessary for definitively identifying hierarchical mergers as this and other evolutionary channels, such as stellar collisions in young stellar clusters (Di Carlo *et al.* 2019) or growth in active galactic nucleus discs (McKernan *et al.* 2012), can grow black holes to masses above the PISN cut-off. These black holes would be classified as hierarchical mergers within our globular cluster picture. Our method can be extended to include additional subpopulations. This would require defining models for the additional subpopulations, for example, including an aligned spin distribution in addition to the isotropic distribution of spin assumed here, as detailed in Eq. (5), to model the expected difference in spins between the binaries formed via isolated evolution and formed dynamically (Kalogera 2000; Rodriguez *et al.* 2016b). Then additional terms would need to be added to the overall likelihood, Eq. (26), for each subpopulation. With only the 10 binaries from the first two observing runs we would not be able to place tight constraints on the relative contributions from different channels (Abbott *et al.* 2019b), but this will change as the catalogue grows with further observing runs (Vitale *et al.* 2017; Stevenson *et al.* 2017; Zevin *et al.* 2017; Talbot & Thrane 2017).

The third observing run of LIGO and Virgo began in April 2019 and was suspended in March 2020. The fourth observing run, which will extend the global GW detector network to include KAGRA (Akutsu *et al.* 2019), is scheduled to start in mid 2021 (Abbott *et al.* 2020). As we gather more observing time, and improve the sensitivity of the detector network, we expect the number of observations and the rate of discoveries to increase. With larger catalogues of events it will be possible to make more precise measurements of the popula-

tion, and there will be a greater probability that at least one event is the result of a hierarchical merger. Furthermore, improvements in the detectors' low-frequency sensitivity will improve their ability to detect higher mass binaries (Abbott *et al.* 2017b). The next generation of ground-based detectors offers the opportunity to perform the same measurements across cosmic time (Kalogera *et al.* 2019). With the precise population measurements coming from larger catalogues we can infer the details of the physical processes which shape black hole formation, but for these conclusions to be accurate, it is necessary to account for the population being a mix of both 1G black holes and the products of mergers.

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APPENDIX

Here we present the full sets of inferred population parameter Λ posteriors for our population models. In Fig. 8, we plot the parameters determining the mass distributions, as defined in Eq. (2) and Eq. (3), for our default model. In Fig. 9 we plot the equivalent mass population parameters for the model excluding the zero-spin subcomponent, and in Fig. 10 we plot the mass population parameters when we switch to using a uniform prior for m_{\max} . The results are largely consistent between model choices.

When using the astrophysically motivated prior for m_{\max} , the posterior closely follows the prior. The posterior on m_{\max} is more restricted at smaller values of the power-law index α : when the mass distribution is flatter we are more sensitive to the upper cutoff than when the distribution sharply decreases with mass and we can increase the upper cutoff with little consequence (Fishbach & Holz 2017). When switching to the uniform prior on m_{\max} we see the same qualitative behaviour with varying α . For steep power laws ($\alpha \gtrsim 2$), we are effectively insensitive to the existence of an upper cut-off, but for flatter power laws ($\alpha \lesssim 1$), the dearth of higher mass black holes means that there is little posterior support for $m_{\max} \gtrsim 45M_{\odot}$.

The power-law index α has more support for higher ($\alpha \gtrsim 2$) values. Our posterior on α is truncated by our choice of prior. Abbott et al. (2019b) found that the posterior on α becomes uninformative at large values ($\alpha \gtrsim 4$), with all values matching equally well.

The Gaussian component of the mass spectrum has a mean well constrained between $\mu_m \simeq 25\text{--}35M_{\odot}$. The exception to this is when $\lambda_m \sim 0$, as then the Gaussian component is negligible and so can be positioned anywhere. There is a correlation between the width of the Gaussian component σ_m and the mean (Talbot & Thrane 2018), with smaller μ_m permissible when σ_m is larger as this enables the upper edge of the Gaussian to stay in place. The value of σ_m is not well constrained by the current set of observations.

The posteriors for the minimum mass m_{\min} are largely unconstrained. As the GW detectors are less sensitive to low mass systems, it is more difficult to place constraints on this end of the distribution (Fishbach & Holz 2017; Talbot & Thrane 2018; Abbott et al. 2019b). The lower limit of the m_{\min} distribution is set by our prior, and the upper limit is set by the least massive black hole amongst our observations. The upper limits are comparable in all cases; however, when the zero-spin component is included (with either m_{\max} prior), we observe an additional peak around $7M_{\odot}$. The difference arises because when a zero-spin component is included it is more probable that we have 1G+2G binaries, and in this case it is possible the GW151226 is a 1G+2G system if m_{\min} is pushed down to $\lesssim 7M_{\odot}$. As shown in Fig. 6, the odds ratio that GW151226 is 1G+2G is less than 1, but not completely negligible (after GW170729, GW151226 has the second highest odds of being a hierarchical merger, despite its low mass). GW151226 is picked out in this way as its source almost certainly contains a spinning black hole (Abbott et al. 2016d, 2019a; Miller et al. 2020). Fixing spins to be zero breaks the mass–spin degeneracy (Poisson & Will 1995; Baird et al. 2013; Farr et al. 2016), resulting in a more equal mass ratio and a larger m_2 . Since GW151226 is inconsistent with zero spin, it cannot be reweighted this way. This potentially makes GW151226 unusual in both its mass ratio and spin compared to the 1G+1G population, while both higher spins and more unequal mass ratios are expected for 1G+2G systems. Since the odds ratio remains low, whether or not GW151226 is a hierarchical merger does not have a significant influence on most population parameters. However, the value of m_{\min} is sensitive to only the lowest mass binaries, and so maybe influenced by the inferred properties for GW151226.

In Fig. 11, we plot the parameters determining the mass distributions, as defined in Eq. (4), for our default model. In Fig. 9 we plot the equivalent mass population parameters for the model with $\lambda_0 = 0$, and in Fig. 10 we plot the mass population parameters when using a uniform prior for m_{\max} . The m_{\max} prior makes negligible difference to the spin distributions. In all cases we favor models with $\alpha_{\chi} < \beta_{\chi}$, which corresponds to distributions which decrease with increasing spin magnitude (Farr et al. 2017; Abbott et al. 2019b). There is no simple correlation between the fraction of 1G+1G binaries with zero spin λ_0 and the other population parameters. The multimodal λ_0 distribution shows that the population can be well described with a large fraction ($\lambda_0 \simeq 0.8$) of zero-spin binaries, with the Beta distribution describing the few binaries with non-zero spin, or with a low fraction ($\lambda_0 \simeq 0$) of zero-spin binaries, and binaries typical 1G+1G binaries have small, but non-zero spins.

REFERENCES

- Aasi, J., et al. 2015, *Class. Quant. Grav.*, 32, 074001
- Abbott, B. P., et al. 2016a, *Phys. Rev. Lett.*, 116, 061102
- . 2016b, *Astrophys. J.*, 818, L22
- . 2016c, *Phys. Rev. Lett.*, 116, 241102
- . 2016d, *Phys. Rev. Lett.*, 116, 241103
- . 2017a, *Phys. Rev. Lett.*, 118, 221101, [Erratum: *Phys. Rev. Lett.* 121, no. 12, 129901 (2018)]
- . 2017b, *Phys. Rev.*, D96, 022001
- . 2019a, *Phys. Rev.*, X9, 031040
- . 2019b, *Astrophys. J.*, 882, L24
- . 2020, arXiv:1304.0670v10
- Abbott, R., et al. 2019c, arXiv:1912.11716
- Acernese, F., et al. 2015, *Class. Quant. Grav.*, 32, 024001
- Akutsu, T., et al. 2019, *Nat. Astron.*, 3, 35
- Antonini, F., Gieles, M., & Gualandris, A. 2019, *Mon. Not. Roy. Astron. Soc.*, 486, 5008

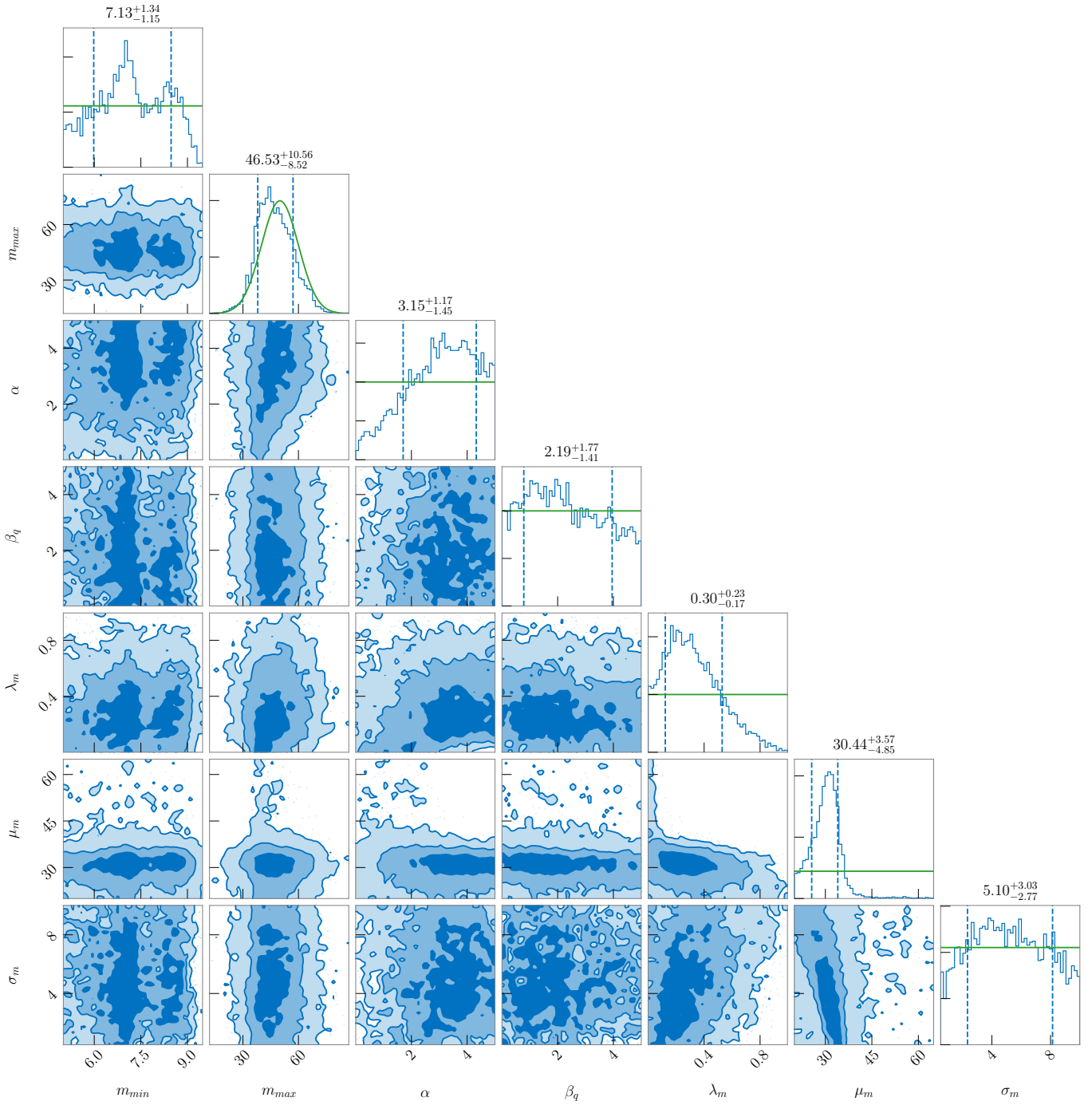


Figure 8. Inferred posterior distributions of the hyperparameters governing the mass and mass ratio distributions, when we allow a fraction of 1G black holes to form in the zero-spin channel. The dashed lines give the 68% credible intervals, and the green lines indicate the priors

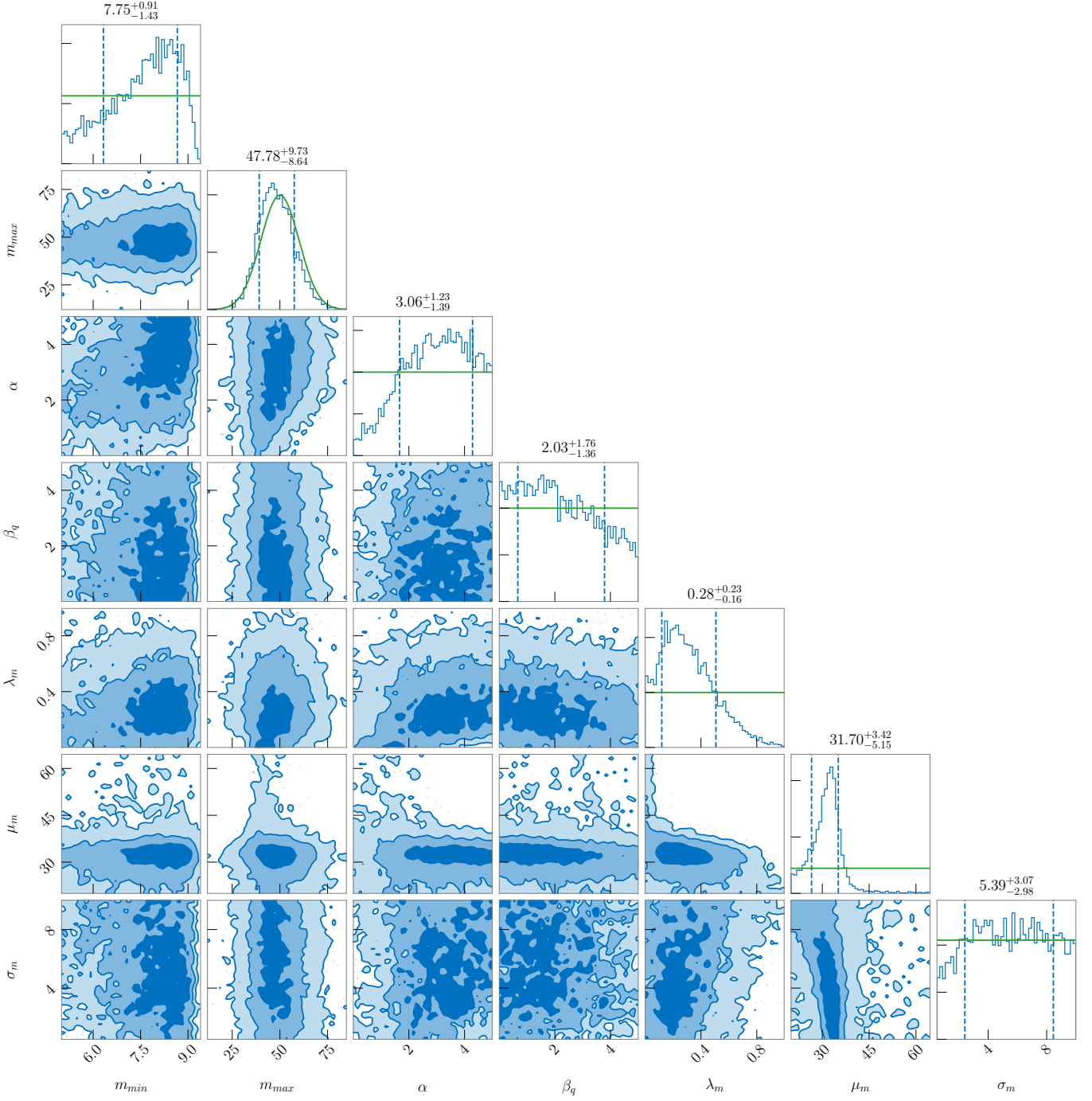


Figure 9. Inferred posterior distributions of the hyperparameters governing the mass and mass ratio distributions when excluding the zero-spin formation channel. The dashed lines give the 68% credible intervals, and the green lines indicate the priors

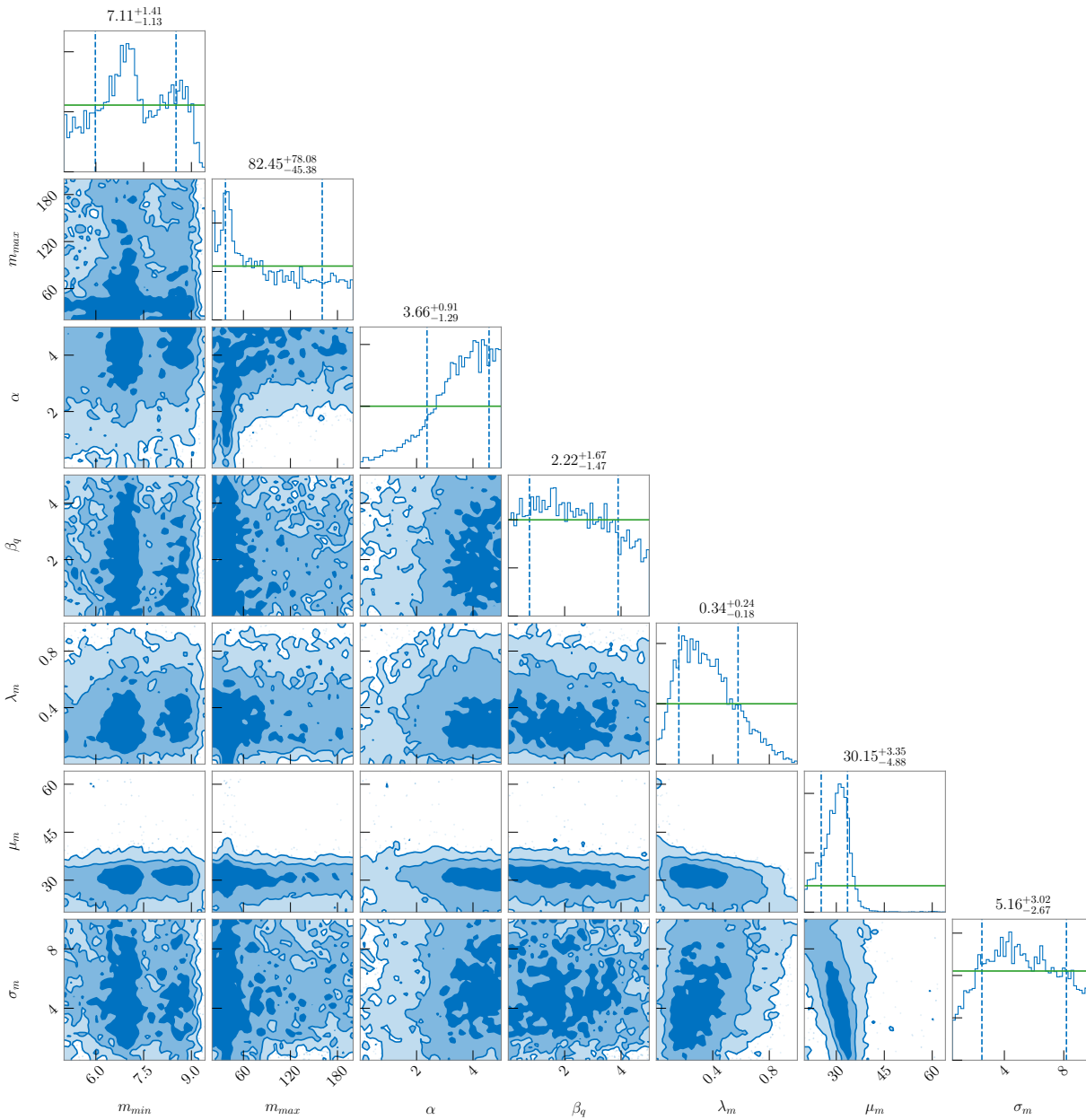


Figure 10. Inferred posterior distributions of the hyperparameters governing the mass distributions when we assume a flat prior on m_{max} . The dashed lines give the 68% credible intervals, and the green lines indicate the priors.

Antonini, F., & Rasio, F. A. 2016, *Astrophys. J.*, 831, 187
 Arca Sedda, M., Mapelli, M., Spera, M., Benacquista, M., & Giacobbo, N. 2020, arXiv:2003.07409
 Ashton, G., et al. 2019, *Astrophys. J. Suppl.*, 241, 27
 Baird, E., Fairhurst, S., Hannam, M., & Murphy, P. 2013, *Phys. Rev.*, D87, 024035
 Banerjee, S., Baumgardt, H., & Kroupa, P. 2010, *Mon. Not. Roy. Astron. Soc.*, 402, 371
 Barkat, Z., Rakavy, G., & Sack, N. 1967, *Phys. Rev. Lett.*, 18, 379

Barrett, J. W., Gaebel, S. M., Neijssel, C. J., et al. 2018, *Mon. Not. Roy. Astron. Soc.*, 477, 4685
 Belczynski, K., Dominik, M., Bulik, T., et al. 2010, *Astrophys. J.*, 715, L138
 Belczynski, K., et al. 2016, *Astron. Astrophys.*, 594, A97
 Blanchet, L. 2014, *Living Rev. Rel.*, 17, 2
 Bruegmann, B., Gonzalez, J. A., Hannam, M., Husa, S., & Sperhake, U. 2008, *Phys. Rev.*, D77, 124047
 Buonanno, A., Kidder, L. E., & Lehner, L. 2008, *Phys. Rev.*, D77, 026004

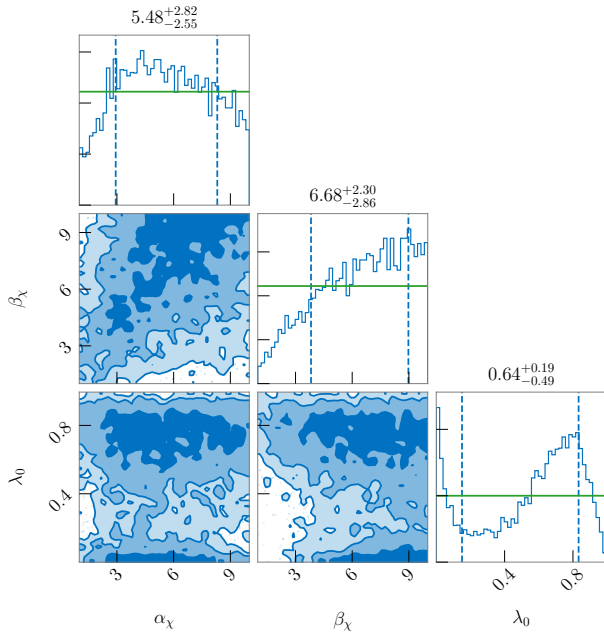


Figure 11. Inferred posterior distributions of the hyperparameters governing the spin distributions, when we allow a fraction of 1G black holes to form in the zero-spin channel. The dashed lines give the 68% credible intervals, and the green lines indicate the priors

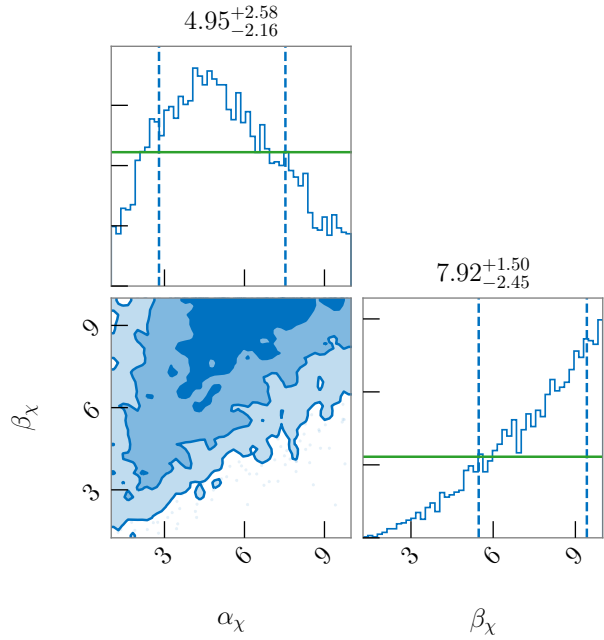


Figure 12. Inferred posterior distributions of the hyperparameters governing the spin distributions when excluding the zero-spin formation channel. The dashed lines give the 68% credible intervals, and the green lines indicate the priors

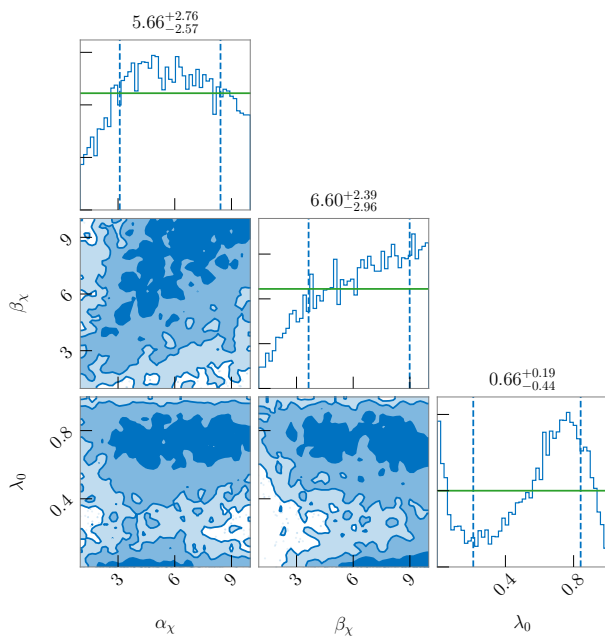


Figure 13. Inferred posterior distributions of the hyperparameters governing the spin distributions when we assume a flat prior on m_{max} . The dashed lines give the 68% credible intervals, and the green lines indicate the priors.

- Campanelli, M., Lousto, C. O., Zlochower, Y., & Merritt, D. 2007, *Astrophys. J.*, 659, L5
- Chatziioannou, K., et al. 2019, *Phys. Rev.*, D100, 104015
- Cutler, C., & Flanagan, E. E. 1994, *Phys. Rev.*, D49, 2658
- Di Carlo, U. N., Mapelli, M., Bouffanais, Y., et al. 2019, arXiv:1911.01434
- Doctor, Z., Wysocki, D., O’Shaughnessy, R., Holz, D. E., & Farr, B. 2019, arXiv:1911.04424
- Downing, J. M. B., Benacquista, M. J., Giersz, M., & Spurzem, R. 2011, *Mon. Not. Roy. Astron. Soc.*, 416, 133
- Ertl, T., Woosley, S. E., Sukhbold, T., & Janka, H. T. 2019, arXiv:1910.01641
- Farmer, R., Renzo, M., de Mink, S. E., Marchant, P., & Justham, S. 2019, arXiv:1910.12874
- Farr, B., et al. 2016, *Astrophys. J.*, 825, 116
- Farr, W. M., Fishbach, M., Ye, J., & Holz, D. 2019, *Astrophys. J. Lett.*, 883, L42
- Farr, W. M., Stevenson, S., Coleman Miller, M., et al. 2017, *Nature*, 548, 426
- Finn, L. S., & Chernoff, D. F. 1993, *Phys. Rev.*, D47, 2198
- Fishbach, M., & Holz, D. E. 2017, *Astrophys. J.*, 851, L25
- Fishbach, M., Holz, D. E., & Farr, B. 2017, *Astrophys. J.*, 840, L24
- Fowler, W. A., & Hoyle, F. 1964, *Astrophys. J. Suppl.*, 9, 201
- Fryer, C. L., Woosley, S. E., & Heger, A. 2001, *Astrophys. J.*, 550, 372
- Fuller, J., & Ma, L. 2019, *Astrophys. J.*, 881, L1
- Gerosa, D., & Berti, E. 2017, *Phys. Rev.*, D95, 124046
- Gerosa, D., & Kesden, M. 2016, *Phys. Rev.*, D93, 124066
- Gonzalez, J. A., Sperhake, U., Bruegmann, B., Hannam, M., & Husa, S. 2007, *Phys. Rev. Lett.*, 98, 091101
- Healy, J., Lousto, C. O., & Zlochower, Y. 2014, *Phys. Rev.*, D90, 104004
- Heger, A., Fryer, C. L., Woosley, S. E., Langer, N., & Hartmann, D. H. 2003, *Astrophys. J.*, 591, 288
- Heger, A., & Woosley, S. E. 2002, *Astrophys. J.*, 567, 532
- Heggie, D. C. 1975, *Mon. Not. Roy. Astron. Soc.*, 173, 729
- Heggie, D. C., Hut, P., & McMillan, S. L. W. 1996, *ApJ*, 467, 359
- Jiménez-Forteza, X., Keitel, D., Husa, S., et al. 2017, *Phys. Rev.*, D95, 064024
- Kalogera, V. 2000, *Astrophys. J.*, 541, 319
- Kalogera, V., et al. 2019, arXiv:1903.09220
- Kimball, C., Berry, C. P. L., & Kalogera, V. 2020, *R. Notes AAS*, 4, 2
- Kruckow, M. U., Tauris, T. M., Langer, N., Kramer, M., & Izzard, R. G. 2018, *Mon. Not. Roy. Astron. Soc.*, 481, 1908
- Lousto, C. O., & Zlochower, Y. 2011, *Phys. Rev. Lett.*, 107, 231102
- Mandel, I., & Farmer, A. 2018, arXiv:1806.05820
- Mapelli, M., Spera, M., Montanari, E., et al. 2019, arXiv:1909.01371
- Marchant, P., Renzo, M., Farmer, R., et al. 2018, arXiv:1810.13412
- McKernan, B., Ford, K. E. S., Lyra, W., & Perets, H. B. 2012, *Mon. Not. Roy. Astron. Soc.*, 425, 460
- Merritt, D., Milosavljevic, M., Favata, M., Hughes, S. A., & Holz, D. E. 2004, *Astrophys. J.*, 607, L9
- Miller, M. C., & Hamilton, D. P. 2002, *Astrophys. J.*, 576, 894
- Miller, M. C., & Miller, J. M. 2014, *Phys. Rept.*, 548, 1
- Miller, S., Callister, T. A., & Farr, W. 2020, arXiv:2001.06051
- Moody, K., & Sigurdsson, S. 2009, *Astrophys. J.*, 690, 1370
- Neijssel, C. J., Vigna-Gómez, A., Stevenson, S., et al. 2019, arXiv:1906.08136
- Plummer, H. C. 1911, *Mon. Not. Roy. Astron. Soc.*, 71, 460
- Poisson, E., & Will, C. M. 1995, *Phys. Rev.*, D52, 848
- Portegies Zwart, S. F., & McMillan, S. 2000, *Astrophys. J.*, 528, L17
- Pretorius, F. 2005, *Phys. Rev. Lett.*, 95, 121101
- Pürerer, M., Hannam, M., & Ohme, F. 2016, *Phys. Rev.*, D93, 084042
- Qin, Y., Fragos, T., Meynet, G., et al. 2018, *Astron. Astrophys.*, 616, A28, [*Astron. Astrophys.*616,A28(2018)]
- Reisswig, C., Husa, S., Rezzolla, L., et al. 2009, *Phys. Rev.*, D80, 124026
- Rodriguez, C. L., Amaro-Seoane, P., Chatterjee, S., & Rasio, F. A. 2018, *Phys. Rev. Lett.*, 120, 151101
- Rodriguez, C. L., Chatterjee, S., & Rasio, F. A. 2016a, *Phys. Rev.*, D93, 084029
- Rodriguez, C. L., Zevin, M., Amaro-Seoane, P., et al. 2019, *Phys. Rev.*, D100, 043027
- Rodriguez, C. L., Zevin, M., Pankow, C., Kalogera, V., & Rasio, F. A. 2016b, *Astrophys. J.*, 832, L2
- Sigurdsson, S., & Phinney, E. S. 1993, *ApJ*, 415, 631
- Speagle, J. S. 2019, arXiv:1904.02180
- Spera, M., & Mapelli, M. 2017, *Mon. Not. Roy. Astron. Soc.*, 470, 4739
- Spera, M., Mapelli, M., & Bressan, A. 2015, *Mon. Not. Roy. Astron. Soc.*, 451, 4086
- Sperhake, U. 2015, *Class. Quant. Grav.*, 32, 124011
- Stevenson, S., Berry, C. P. L., & Mandel, I. 2017, *Mon. Not. Roy. Astron. Soc.*, 471, 2801
- Stevenson, S., Ohme, F., & Fairhurst, S. 2015, *Astrophys. J.*, 810, 58

- Stevenson, S., Sampson, M., Powell, J., et al. 2019, arXiv:1904.02821
- Talbot, C., Smith, R., Thrane, E., & Poole, G. B. 2019, Phys. Rev., D100, 043030
- Talbot, C., & Thrane, E. 2017, Phys. Rev., D96, 023012
- . 2018, Astrophys. J., 856, 173
- Thrane, E., & Talbot, C. 2019, Publ. Astron. Soc. Austral., 36, e010
- Varma, V., Isi, M., & Biscoveanu, S. 2020, arXiv:2002.00296
- Vitale, S., Lynch, R., Sturani, R., & Graff, P. 2017, Class. Quant. Grav., 34, 03LT01
- Vitale, S., Lynch, R., Veitch, J., Raymond, V., & Sturani, R. 2014, Phys. Rev. Lett., 112, 251101
- Woosley, S. E. 2017, Astrophys. J., 836, 244
- Woosley, S. E., Blinnikov, S., & Heger, A. 2007, Nature, 450, 390
- Woosley, S. E., & Heger, A. 2015, Astrophys. Space Sci. Libr., 412, 199
- Woosley, S. E., Heger, A., & Weaver, T. A. 2002, Rev. Mod. Phys., 74, 1015
- Wysocki, D., Lange, J., & O’Shaughnessy, R. 2019, Phys. Rev., D100, 043012
- Yang, Y., et al. 2019, Phys. Rev. Lett., 123, 181101
- Zevin, M., Pankow, C., Rodriguez, C. L., et al. 2017, Astrophys. J., 846, 82