Modeling ringdown: Beyond the fundamental quasinormal modes

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While black hole perturbation theory predicts a rich quasi-normal mode structure, technical challenges have limited the numerical study of excitations to the fundamental, lowest order modes caused by the coalescence of black holes. Here, we present a robust method to identify quasinormal mode excitations beyond the fundamentals within currently available numerical relativity waveforms. In applying this method to waveforms of 68 initially nonspinning black hole binaries, of mass-ratios 1:1 to 15:1, we find not only the fundamental quasinormal mode amplitudes, but also overtones, and evidence for second order quasinormal modes. We find that the mass-ratio dependence of quasinormal mode excitation is very well modeled by a post-Newtonian-like sum in symmetric mass-ratio. Concurrently, we find that the mass-ratio dependence of some quasinormal mode excitations is qualitatively different from their post-Newtonian inspired counterparts, suggesting that the imprints of nonlinear merger are more evident in some modes than in others. We present new fitting formulas for the related quasinormal mode excitations, as well as for remnant black hole spin and mass. We also discuss the relevance of our results in terms of gravitational wave detection and characterization.

I. INTRODUCTION

As we approach the era of gravitational wave (GW) detection, there is a tremendous effort to understand and predict the rich gravitational wave signals coming from all expected sources of radiation. These predictions are used to construct GW templates that will enable not only the recognition of GW signals within noise, but also the extraction of information about the source. It is for these purposes that the development of templates that include the final moments of binary black hole (BBH) coalescence is important for future GW detection.

While source populations remain uncertain, BBH systems are expected to account for multiple signals per year and, if systems with a total mass of a few hundred times that of our sun or larger are observed, detectors such as Advanced LIGO and the Einstein Telescope are most sensitive to the final stages of BBH coalescence [1–4]. In these final moments the two black holes (BHs) merge into a perturbed, remnant BH, whose gravitational radiation rings down like a struck bell. Very roughly put, if one were to observe the remnant at an orientation (θ, ϕ) relative to its spin axis, and at a distance r away, then the observable time domain strain of this decaying ringdown radiation may be written as the real part of

$$h = -\frac{1}{r} \sum_{l,m,n} A_{lmn} S_{lmn}(\theta,\phi) \frac{e^{i(\omega_{lmn} + i/\tau_{lmn}) t}}{(\omega_{lmn} + i/\tau_{lmn})^2}$$
(1)
= $h_{+} - i h_{\times}$.

Here, h_{+} and h_{\times} are the real valued plus and cross polarization states. In general, a linear combination of these states will be detected [5, 6].

If provided the remnant BH's mass and spin, then the perturbation theory of isolated Kerr BHs informs us of Eq.(1)'s spatial multipoles and temporal frequencies: the Quasi-Normal Modes (QNMs) that dominate ringdown [7–9]. However, in order to model astrophysically relevant ringdown signals the output of numerical relativity (NR) simulation is generally needed to tell us how much

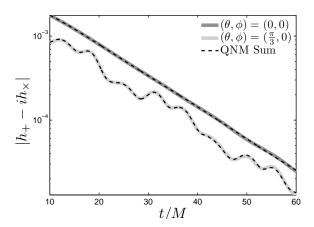


FIG. 1. Ringdown for a 2:1 mass-ratio, initially nonspinning BH binary calculated via the GaTech MAYA code [11–15]. The solid gray lines show the time domain envelope of NR ringdown for two different lines of sight. Here θ and ϕ are polar and azimuthal angles relative to the BHs final spin vector. The dashed black lines show the corresponding model ringdowns (QNM sums) calculated using the results of this paper: estimation of spheroidal QNM excitations from NR, including and beyond the fundamental overtones.

each multipolar component is excited for a given initial binary [9, 10].

For this reason, applying BH perturbation theory to the analysis of NR ringdown has assisted in the creation of inspiral-merger-ringdown templates [16–18], and revealed novel relationships between the initial binary's configuration and the remnant BH's parameters [10]. But thus far, technical challenges have limited analysis primarily to the fundamental (lowest overtone) QNMs, while it has also been acknowledged that a more detailed application of perturbation theory to NR ringdown may be needed [10, 16, 19–23]. As an example of ringdown's potential complexity, Fig. 1 shows the time domain strain envelope of a potential 2:1 mass-ratio ringdown signal of an initially nonspinning BH binary, observed at

two different lines of sight. Here we see that the sum of many QNMs precisely models NR ringdown data. This example case demonstrates that both the intrinsic QNMs of perturbation theory and the observer's extrinsic line of sight contribute to the richness of possible ringdown signals.

In this study we assist in clarifying the extent to which QNMs beyond the fundamentals are pertinent to the physics and modeling of NR ringdown (e.g. Fig. 1). We consider the ringdown of 68 initially nonspinning BBH simulations of mass-ratios between 1:1 and 1:15. In doing so, we find that QNM excitation is exceptionally well modeled by a post-Newtonian-like (PN-like) expansion (Sec.IV). However, we also find that the excitation amplitudes of some QNMs differ qualitatively from their post-Newtonian (PN) counterparts, suggesting that the

imprints of nonlinear merger are more evident in these QNMs than in others (Sec.VIA). But first, we present a robust method to estimate multiple QNMs within NR ringdown (Sec.IIIA). We then apply this method to a series of initially nonspinning NR runs of varying massratio (Sec.IIIB-IVB). Lastly, we consider the results of our analysis (overtones and second order modes) in the context of ringdown-only templates (Sec.VIB). Generally, our results may be of use for the construction of merger-ringdown templates.

A complete paper outline is given in Sec. I C. A full summary of fitting formulas and coefficients for QNM excitations is given in Appendix A. For convenience, fits for the most dominant QNM excitation amplitudes in Eq.(1) are below:

$$A_{220}(\eta) = \tilde{\omega}_{220}^2 \left(0.9252 e^{0.0000i} \eta + 0.1323 e^{0.0000i} \eta^2\right) \tag{2}$$

$$A_{221}(\eta) = \tilde{\omega}_{221}^2 \left(0.1275 e^{5.3106i} \eta + 1.1882 e^{0.4873i} \eta^2 + 8.2709 e^{3.3895i} \eta^3 + 26.2329 e^{0.1372i} \eta^4 \right)$$
(3)

$$A_{210}(\eta) = \tilde{\omega}_{210}^2 \sqrt{1 - 4\eta} \left(0.4795 e^{3.5587i} \eta + 1.1736 e^{1.5679i} \eta^2 + 1.2303 e^{6.0496i} \eta^3 \right)$$
(4)

$$A_{330}(\eta) = \tilde{\omega}_{330}^2 \sqrt{1 - 4\eta} \left(0.4247 e^{5.4979i} \eta + 1.4742 e^{3.6524i} \eta^2 + 4.3139 e^{6.0787i} \eta^3 + 15.7264 e^{3.2053i} \eta^4 \right) \tag{5}$$

$$A_{331}(\eta) = \tilde{\omega}_{331}^2 \sqrt{1 - 4\eta} \left(0.1480 e^{2.9908i} \eta + 1.4874 e^{0.5635i} \eta^2 + 10.1637 e^{4.2348i} \eta^3 + 29.4786 e^{1.7619i} \eta^4 \right) \tag{6}$$

$$A_{320}(\eta) = \tilde{\omega}_{320}^2 \left(0.1957 e^{5.8008i} \eta + 1.5830 e^{3.2194i} \eta^2 + 5.0338 e^{0.6843i} \eta^3 + 3.7366 e^{4.1217i} \eta^4\right) \tag{7}$$

$$A_{440}(\eta) = \tilde{\omega}_{440}^2 \left(0.2531 \, e^{1.5961i} \eta + 2.4040 \, e^{5.1851i} \eta^2 + 14.7273 \, e^{1.9953i} \eta^3 + 67.3624 \, e^{4.9143i} \eta^4 + 126.5858 \, e^{1.8502i} \eta^5 \right) \tag{8}$$

$$A_{430}(\eta) = \tilde{\omega}_{430}^2 \sqrt{1 - 4\eta} \left(0.0938 \, e^{3.2607i} \eta + 0.8273 \, e^{0.7704i} \eta^2 + 3.3385 \, e^{4.8264i} \eta^3 + 4.6639 \, e^{2.7047i} \eta^4 \right) \tag{9}$$

$$A_{550}(\eta) = \tilde{\omega}_{550}^2 \sqrt{1 - 4\eta} \left(0.1548 e^{5.3772i} \eta + 1.5091 e^{2.5764i} \eta^2 + 8.9333 e^{5.5995i} \eta^3 + 42.3431 e^{2.1269i} \eta^4 + 89.1947 e^{5.3348i} \eta^5 \right)$$

$$(10)$$

Here, M is the sum of the initial BH masses,

$$M = \mathbf{m}_1 + \mathbf{m}_2 \;,$$

and η is the symmetric mass-ratio,

$$\eta = \frac{\mathbf{m}_1 \mathbf{m}_2}{M^2} \; .$$

The amplitudes are scaled relative to 10 M after the peak luminosity in ψ_{22}^{NR} (Sec. 1B),

Note that the QNM frequencies, $\tilde{\omega}_{lmn}$, are complex, and depend on the remnant BH's parameters: spin magnitude and mass.

$$\tilde{\omega}_{lmn} \equiv \omega_{lmn} + i/\tau_{lmn} \tag{11}$$

In Eq.(11), ω_{lmn} is the QNM's central oscillation frequency, and τ_{lmn} the mode's decay time. Each frequency may be conveniently computed using the mapping between η and remnant BH parameters given in Eqs. C2 and C1, or Ref. [24], along with the phenomenological fitting formulas¹ for QNM frequencies in Ref. [25].

A. From QNMs and templates to NR ringdown analysis

Shortly after Vishveshwara's 1970 discovery that perturbed black holes dissipate energy via gravitational ringdown, the study of perturbed BHs began a proliferation that now enables the creation of GW ringdown templates [26–28]. In 1971 Teukolsky and Press revealed that ringdown should be well approximated by a sum of eigenfunctions of Teukolsky's master equation which describes first order departures from the Kerr metric [7, 29, 30]. For a BH of mass M_f and dimensionless spin parameter,

$$j_f = \frac{s_f}{M_f^2} \;,$$

these eigenfunctions are uniquely determined. Here s_f is the magnitude of the final BH spin vector. Press later referred to Teukolsky's set of radial, angular, and temporal eigenfunctions as QNMs [27, 30] [Eq.(14)]. QNMs are multipoles with the usual polar and azimuthal indices, ℓ and m. In addition, in loose analogy with acoustic theory, they are also labeled by an *overtone* number, $n = \{0, 1, 2...\}$, where, as n increases, so does the typical

¹ Note that here $\tilde{\omega}_{lmn}$ are in units of 1/M while [25] reports the unitless $M \tilde{\omega}_{lmn}$.

QNM decay rate [8]. The n = 0 QNMs are traditionally referred to as the fundamental modes.

Given that astrophysical BHs are expected to be described by only mass and spin, the work of developing GW templates that include ringdown is largely equivalent to modeling the excitations of Kerr QNMs for different progenitor binaries [28, 31]. This work has largely focused on the most slowly decaying, fundamental QNMs, which correspond to first order departures from the Kerr metric.

However, it has been suggested that second order QNMs, resulting from *nonlinear* self-coupling of their first order counterparts, may also be pertinent [21, 32–36]. Although these second order QNMs have largely been studied for Schwarzschild BHs, where Regge-Wheeler-Zerilli techniques can be directly applied, formal results for the Kerr case do not appear to exceed [32], wherein the second order contribution's wave equation is derived within the Newman-Penrose formalism.

This result demonstrates that the second order wave equation for Kerr, like its Schwarzschild counterpart, is sourced by a quadratic function of the first order modes. For this reason it is expected that the second order QNMs for Kerr are characteristically similar to those for Schwarzschild [34]. In particular, one might expect to find within Fig. 1 damped sinusoids whose frequencies and decay rates are sums of those from two first order modes².

From these considerations it is clear that perturbation theory allows for an extremely rich space of possible ringdown signals. But given that the fundamental modes are the slowest damped, it is not immediately clear that modes beyond the fundamentals are pertinent to modeling of NR ringdown. Indeed, the single and two-mode ringdown-only templates of Ref. [28] only consider fundamental QNMs. Similarly, studies that focus on linking QNM excitation with initial binary parameters typically focus only on the fundamental modes [10, 37, 38] and, while work on templates that include both merger and ringdown has found that overtones are required to blend the two regions, a systematic study of overtone excitement is lacking [16, 18, 22, 23]. Moreover, there has been no work published on the detection of nonlinear second order QNMs within NR BBH coalescence. Here, we inform these areas by describing QNM excitation for a series of initially nonspinning, unequal mass BBH systems.

For the recovery of these initial parameters precise agreement between template and signal is needed. Concurrently, only qualitative agreement is needed for detection purposes [28, 31]. Although a full exploration of detection and parameter estimation is beyond the scope of the current study, we note that the richness of possible signals depends not only on the configuration of the initial binary, but also the orientation of the BH's final spin vector with respect to the observer's line of sight.

As an example, consider again Fig. 1. Here we see that if this idealized signal is observed along the remnant BH's final spin axis, $\theta=0$, then the envelope of its time domain behavior appears to be dominated by a single exponentially decaying function, or equivalently, a single QNM; however, if observed at a significant angle with respect to the final spin axis, here $\theta=\pi/3$, then many QNMs may visibly contribute. In order to model the complexities of these potential signals, we utilize the intersections between perturbation theory and NR.

B. Numerical relativity meets perturbation theory

NR waveforms are typically decomposed³ into spin weighted-2 spherical harmonics, $_{-2}Y_{lm}(\theta,\phi)$, such that the Weyl scalar ψ_4 is given by

$$\psi_4(t,\theta,\phi,r) = \frac{1}{r} \sum_{l,m} \psi_{lm}^{NR}(t) \left[{}_{-2}Y_{lm}(\theta,\phi) \right].$$
 (12)

For gravitational radiation, the orthogonality of these harmonics in both ℓ and m ensures that this is a true spectral decomposition:

$$\psi_{lm}^{NR}(t) \equiv r \int_{\Omega} \psi_4(t, \theta, \phi, r) {}_{-2}\bar{Y}_{lm}(\theta, \phi) \,\mathrm{d}\Omega \,. \tag{13}$$

Here $_{-2}\bar{Y}_{lm}(\theta,\phi)$ is the complex conjugate of $_{-2}Y_{lm}(\theta,\phi)$, and we will focus on ψ_{lm}^{NR} , the spherical harmonic multipoles of the Weyl scalar ψ_4 . The Weyl scalar ψ_4 is related to the observable strain via two time derivatives, $\psi_4 = -\ddot{h}$ [5].

During ringdown, this choice of multipolar decomposition effectively casts the radiation as that corresponding to a perturbed *nonspinning* BH [5]. However the remnant of a BBH merger is typically a spinning BH.

For these cases, the perturbation theory of Kerr BHs [39] yields

$$\psi_4(t,\theta,\phi) \approx \frac{1}{r} \sum_{l,m,n} \psi_{lmn}^{\rm PT}(t) \left[-2S_{lm}(j_f \tilde{\omega}_{lmn},\theta,\phi) \right] (14)$$

$$\psi_{lmn}^{\rm PT}(t) \equiv A_{lmn} e^{i\tilde{\omega}_{lmn}t} (15)$$

where $\tilde{\omega}_{lmn}$ is the complex QNM frequency, $_{-2}S_{lm}$ are the spin weighted *spheroidal* harmonics, and A_{lmn} are the complex QNM amplitudes or *excitation coefficients* whose magnitude is contingent on where t is chosen to be zero [27, 40, 41].

For example, if t_* is the time relative to the peak luminosity of ψ_{22}^{NR} , and one considers ringdown to include

² This is analogous to the anharmonic oscillator, in which the second order oscillation frequency is twice the first order one [34].

³ This decomposition is typically done such that the origin is at the initial binary's center of mass. In general, this is not the location of the remnant BH if there is a nonzero recoil velocity. However, for the systems studied here, the typical distance traveled postmerger, is sufficiently small compared to the waveform extraction radius, making this initial center of mass location a good approximation for the position of the remnant BH. Nevertheless, as discussed in Sec. V, this does potentially introduce detailed effects that may not be inherent to the ringdown regime.

 $T_0 \geq 10$ (M) after $t_* = 0$, then $t \equiv t_* - 10$ (M) [38]. Here we consider t to be in units of the initial binary mass, M, which is canonically set to unity.

Generally, Eq.(14) is not an equality as power-law tails, of the form $\psi_{\rm tail} \sim t^{-k}$, are also expected in the postmerger regime [39, 42]. While, in principle, these power-law contributions may be significant near the radiation's peak, a host of numerical studies has shown them to be extremely weak throughout the subsequent QNM regime⁴ [9, 39]. In particular, while all power-law functions decay slower than exponentials, they also require excitation coefficients much larger than those of QNMs to contribute significantly to the waveform. Therefore there is a heuristic expectation that the power-law tails eventually dominate the postmerger waveform, but only at very late times [39, 45–47]. Indeed, recent NR codes that focus on binary black hole coalescence (BBC) have empirically verified this expectation [9, 22, 23, 38]. Numerical studies that focus specifically on solving Teukolsky's equation do find that power-law tails are physically meaningful, but only at late times, and at amplitudes that are very likely inaccessible to codes that solve Einstein's equations in full [43, 47].

While the current study, in part, seeks to describe ringdown in unprecedented detail, we also find that for the systems considered, power-law decay can be neglected.⁵

For simplicity we have written Eq.(14) as a sum over the first order QNM indices only. If written explicitly, the second order QNM terms, being proportional to products of two first order QNMs, would be labeled by six indices, $(l_1, m_1, n_1)(l_2, m_2, n_2)$ [21, 33, 34]. We have also neglected to explicitly write the *conjugate* or *mirror-mode* terms which arise from Teukolsky's azimuthal equation having two linearly independent solutions that, due to nonzero BH spin, are not the complex conjugates of each other [8, 25].

An additional consequence of nonzero BH spin is that the spheroidal harmonics, while orthogonal in m, are not orthogonal in l for the complex QNM frequencies of ringdown⁶, making a spectral decomposition of the form of Eq.(13) not possible. However, just as the Kerr metric reduces to the Schwarzschild metric for nonspinning BHs, so do the spheroidal harmonics reduce to the sphericals. Substituting Eq.(14) into Eq.(13) illustrates this point by revealing that the spherical multipoles of NR are each a sum of many spheroidal QNMs where, in the $j \rightarrow 0$

limit, only the l = l' term survives

$$\psi_{l'm}^{NR}(t) \approx \sum_{n,l} A_{lmn} \, \sigma_{l'lmn} \, e^{i\tilde{\omega}_{lmn}t} (16)$$

$$\sigma_{l'lmn} \equiv \int_{\Omega} {}_{-2}S_{lm}(j_f \tilde{\omega}_{lmn}, \theta, \phi) {}_{-2}\bar{Y}_{l'm}(\theta, \phi) \,\mathrm{d}\Omega \,(17)$$

This was first noted in 1973 by Press and Teukolsky [7] who used standard operator perturbation theory to show that

$${}_{-2}S_{lm} = {}_{-2}Y_{lm} + j_f \tilde{\omega}_{lmn} \sum_{l \neq l'} {}_{-2}Y_{l'm} c_{l'lm} + O(j_f \tilde{\omega}_{lmn})^2.$$
(18)

Here $c_{l'lm}$ are related to the Clebsch-Gordon coefficients [25, 29].

Equations 16 through 18 motivate two approaches to characterize QNM excitations, A_{lmn} : single-mode and multimode fitting.

Single-mode fitting.— The first category makes the practical assumption that Eq.(16) is dominated by the l = l' term, and thereby estimates the QNM amplitudes by fitting a single mode to ψ_{lm}^{NR} . Although this single-mode approach has been shown to be effective for the first few l = m multipoles [9, 37], in principle, it neglects the presence of overtones and BH spin [19, 27]. Moreover, because Eq.(18) says that the mixing between spherical and spheroidal harmonics becomes more prevalent for higher spins, we may hypothesize that singlemode fitting incurs residuals that are qualitatively proportional to the remnant BH's spin. In particular, Fig. 2 shows that initially nonspinning, quasicircular BBH systems coalesce to form a remnant BHs whose final spin is proportional to the initial binary's symmetric mass-We would therefore expect single-mode fitting of these systems to perform better for low mass-ratios $(m_1 \ll m_2)$, and worse at higher mass-ratios $(m_1 \approx m_2)$.

Specifically, while it has been shown that Eq.(17)'s $\sigma_{l'lmn}$ can be on the order of 0.10 for moderate values of j_f [40], Eq.(16) communicates that the relative values of different A_{lmn} ultimately determine the significance of each QNM term [19].

Multimode fitting.— The second category attempts to fit each term in Eqn. (16), and therefore requires the simultaneous fitting of multiple QNMs within each spherical multipole. Although this multimode approach is more faithful to the fact that the BHs of interest are spinning, current fitting methods have had limited success [23, 50, 51]. The difficulty is primarily due to complexity: within each ψ_{lm}^{NR} , a multimode fitting algorithm must optimize over $\{Re[A_{lmn}], Im[A_{lmn}], \omega_{lmn}, \tau_{lmn}\}$ as well as the total number of significant QNMs, N. There are secondary difficulties arising from data accuracy and numerical artifacts. As a result, the multimode approach is a $4 \times N$ dimensional optimization problem of combinatoric complexity whose solution must be robust against numerical errors. It is a lot like trying to identify a musical chord by ear.

⁴ In contrast to the current study, which evolves the full Einstein equations, studies that are able to resolve late-time power-law decay evolve Teukolsy's equation (e.g. [43]), which is motivated by first-order departures from the Kerr space-time [44].

⁵ This is readily visible in Fig. 3's lower panel where, if power-law tails did contribute significantly, they would cause a localized feature near zero frequency.

⁶ Specifically, we are concerned with spheroidal harmonics with complex frequency and of spin weight s=-2, which correspond to exponentially damped time-domain waveforms. [40, 48]

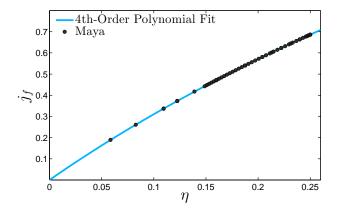


FIG. 2. Remnant BH spin for initially nonspinning systems of varying mass-ratio. The black dots are final spin values calculated using the isolated horizon formalism [49]. The trend is monotonic and well fitted with a fourth order polynomial (Appendix C).

Structure of the paper

In the current study we present a multimode fitting method, and apply it to the NR ringdown of 68 initially nonspinning, unequal mass-ratio binaries with symmetric mass-ratios between $\eta = 0.2500$ and $\eta = 0.0586$.

We report estimates for the QNM excitations of not only fundamental modes, but also for overtones and what appear to be second order modes. We go on to discuss our results in the context of phenomenological ringdown models and future detection scenarios. First, in Sec. II A we review the single-mode approach, and report fit residuals. As described in Sec. IIB, for nominal fitting regions, we find that single-mode fitting incurs roughly 1% fitting errors for the best case scenario, and greater 10% error in the worst case scenarios. We also review the systemic dependence of residuals with final BH spin. In Sec. III A we introduce our multimode fitting method, and compare it with other approaches using mock data in noise, then review found QNM amplitudes and residual errors. In Sec. IV, we present post-Newtonian inspired fits to the dominant QNM excitations across the range of mass-ratios. In Sec. V we discuss the limitations of our results, and their consistency with perturbation theory. Finally, in Sec. VI, we discuss our results in the contexts of analytic (nonlinear) perturbation theory, and review the significance of our findings to a mock detection scenario.

II. MOTIVATIONS FOR MULTIMODE FITTING

Let us first consider the single-mode fitting approach discussed in Sec. IB. Figure 3 shows single-mode fits for a 2:1 mass-ratio binary. While we can see that in this case the subdominant $\psi_{lm}^{\rm NR}(t)$ are not all simple functions, the dominant multipoles do appear to have exponentially decaying envelopes, and so are well modeled by a single QNM. Indeed, previous studies have found success in treating the dominant multipoles as single QNMs during ringdown [9, 37]. In particular, this approach has led to effective numerical estimates of BH final spin and mass, as well as the characterizations of fundamental QNM amplitudes with mass-ratio, and initial spin magnitude [38, 52]. It is therefore fair to suppose that more detailed QNM information is not needed in order to capture ringdown's dominant physics. In what follows, we test this heurism by first outlining the single-mode approach, and then investigating the dependence of fit residuals with initial binary parameters (Fig. 4).

Single-mode fits

First, we outline a qualitatively general single-mode fitting procedure to estimate the fundamental (n = 0)QNM excitations:

- a. Given the set of $\psi_{lm}^{\rm NR}$, we define ringdown to be the region $\{T_0 \leq t \leq T_1\}$ relative to the peak luminosity⁷ of $\psi_{22}^{\rm NR}$ [37].
- b. To calculate the waveform's phase, $\theta_{lm}(t)$, and envelope, $\Psi_{lm}(t)$, we then consider the standard representation for the fit:

$$\psi_{lm}^{Fit}|_{\{T_0 < t < T_1\}} = \Psi_{lm} e^{i\theta_{lm}}$$
.

c. We then use linear least-squares fitting to model $\theta_{lm}(t)$ and $Log[\Psi_{lm}(t)]$ as lines in the time domain:

$$\theta_{lm} = t \,\omega_{lm}^{Fit} + \delta_{lm}^{Fit} \tag{19}$$

$$\theta_{lm} = t \,\omega_{lm}^{Fit} + \delta_{lm}^{Fit} \qquad (19)$$

$$Log[\Psi_{lm}(t)] = -t/\tau_{lm}^{Fit} + \text{Log}|A_{lm}^{Fit}| \qquad (20)$$

where δ_{lm}^{Fit} is the complex phase of A_{lm}^{Fit} .

d. Upon calculating fit parameters, $\{A_{lm}^{Fit}, \omega_{lm}^{Fit}, \tau_{lm}^{Fit}\}$, we calculate the fractional rootmean-square error,

$$\varepsilon_{lm} \equiv \left| \frac{\langle (\psi_{lm}^{NR} - \psi_{lm}^{Fit})^2 \rangle}{\langle \psi_{lm}^{NR}^2 \rangle} \right|^{1/2}.$$
 (21)

Here ε_{lm} is typically much less than 1 for good fits, and of order 1 or greater for poor fits. More carefully, as discussed in Sec.IIC, ε_{lm} is susceptible to being biased by numerical noise. In the worst case scenario, where noise dominates the data to be fit, $\varepsilon_{lm} \approx 1 \text{ may}$ correspond to a minimum residual with respect to fit parameters.

As will be discussed in Sec. IIIA, we consider multiple fitting regions in order to characterize both the data and fit. In the case of single-mode fitting, fitting regions were chosen to encompass between 86 and 74 (M). For the multimode fitting approach to be discussed in Sec. III A, each waveform was windowed and padded after the onset of numerical noise to maintain a consistent frequency domain resolution.

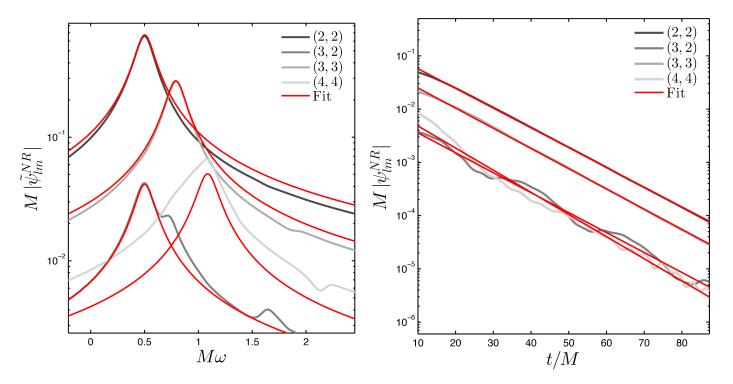


FIG. 3. As demonstrated by this set of 2:1 mass-ratio nonspinning waveforms, fitting a single decaying sinusoid to ψ_{lm}^{NR} incurs systematic residuals. **Top Panel:** The time-domain envelopes for (2,2),(3,3),(3,2),(4,4) spherical multipoles and related fits, starting 10M after the peak luminosity of ψ_{22}^{NR} . **Bottom Panel:** The frequency-domain envelopes, $|\tilde{\psi}_{l,m}^{NR}|$. All fits correspond to the lowest, n=0, QNMs. While the (2,2) and (3,3) multipole waveforms are best described by a single QNM fit, all fits display visible deviations from the raw data.

Typical single-mode fits are shown in Fig. 3 for a 2:1 mass-ratio binary, with the fitting region starting $T_0=10\,M$ after the peak luminosity in $\psi_{22}^{\rm NR}$. Here, as well as throughout this paper, the Fourier transform of waveforms, $\psi(t)$, will be denoted as $\tilde{\psi}(\omega)$. Note that the l=m multipoles are well fit, with associated errors $\varepsilon_{lm}\approx 0.08$. However, a notable exception is the l=m=4 multipole with ε_{44} and order of magnitude higher at ≈ 0.65 .

Moreover, as has been found in previous studies, we also find that the $l \neq m$ multipoles are generally not well fit by a single QNM. For example, the (l,m)=(3,2) multipole, $\psi_{32}^{\rm NR}$, is known to have a significant contribution from the (l,m,n)=(2,2,0) term in Eq.(16) [9, 19, 23, 53]. This may be recognized in the lower panel of Fig. 3, where $\psi_{32}^{\rm NR}$ is seen have its dominant peak not at $\psi_{32}^{\rm PT}$'s central frequency⁸ of $M\omega=0.73$, but at $M\omega=0.50$, directly under the peak of $|\tilde{\psi}_{22}^{\rm NR}|$.

In what follows we discuss the residual error of the single-mode approach. In particular, we ask if the errors are dominated by numerical artifacts (e.g. resolution related errors [52]), or if the errors are dominated by the effects of nonzero BH spin.

B. Single-mode fits: Results and residuals

To investigate the residuals incurred by single-mode fitting, we consider 36 initially nonspinning, unequal mass binaries with η between 0.2500 and 0.0586. The left panel of Fig. 4 shows typical fit excitation amplitudes, $|A_{lm}^{Fit}|$, and the right panel shows the corresponding residual errors (Eq.(21)). The left panel of Fig. 4 shows that QNM excitation appears regular with symmetric massratio with the n=0 mode dominating. The fitting model proposed in Ref. [37] is also plotted. The lower left panel of Fig. 4 indicates that the $(\ell, m, n) = (4, 4, 0)$ has a significant local minimum at $\eta \approx 0.22$ (m₁/m₂ ≈ 2) for the resolution in η considered here. The $(\ell, m, n) = (3, 2, 0)$ QNM has been found to exhibit a similar local minimum [19].

Turning to the right panel of Fig. 4, the $(\ell, m, n) = (2, 2, 0)$ and (3, 3, 0) cases show monotonically decreasing trends. This trend may be due to the difference between spherical and spheroidal harmonics, which is proportional to final BH spin [Eq.(18)], and is therefore also proportional to symmetric mass-ratio (Fig. 2); thus, single-mode fitting may incur systematic errors that decrease with η .

While the ε_{21} and ε_{44} estimates display a more complicated behavior, their overall decrease with η suggests that these cases may be significantly affected not only by QNMs beyond the fundamentals, but also by other sources of errors.

⁸ The central frequency is given by the real part of the QNM frequency.

C. Sources of error

To contrast how much of each ε_{lm} is attributed to nonfundamental QNMs rather than other factors, we briefly review the primary numerical sources of error: finite resolution and extraction radius. In aggregate, we find that the overall effect of these errors contributes to a noise floor that, at $\sim 10^{-6}~(1/rM)$, is typically 2 orders of magnitude lower than the relative fit errors shown in the right panel of Fig. 4. As a general consequence, ε_{lm} is increasingly biased by numerical noise as $|\psi_{lm}^{NR}|$ approaches the noise floor. This is most evident for ε_{44} , which displays a pronounced increase as $|A_{44}^{Fit}|$ sweeps through its local minimum.

For the waveforms used here, the simulation grid is structured so that there is a central grid of maximal resolution within peripheral grids whose resolution decreases by a factor of 2 at each outward extension. The result is an inherent tension between the finite extraction radius, and the finest grid resolution (see Sec. V C for an expanded discussion of finite extraction radius and related gauge effects.). In effect, this means that $\psi_{lm}^{\rm NR}$ up to $\ell=m=5$ are resolved spatially, with ~ 7 points oscillation cycle, and temporally with ~ 42 points per cycle⁹. In particular, we find that duplication of Fig. 4 at $\eta=\{0.25,0.19,0.16\}$ is consistent with resolutions $\{0.62,1.125,1.25\}$ times that of the values quoted above, and, therefore, the right panel of Fig. 4 is not dominated by resolution effects.

Our post-merger data contain low amplitude, high frequency oscillations that contribute at most 5% to our estimates of residual error, ε_{lm} , and appear to be an effect of discretization. This high frequency contribution is visible in Fig. 3 as low amplitude features to the right of each central frequency. While the high frequency of these oscillations means that their contribution to the mean residual difference is small, the magnitude of these oscillations is also marginal across multipoles, and appears at comparable power at the same positive and negative frequency. As seen in Fig. 3, this frequency varies from multipole to multipole. Despite their pervasiveness, these features are too high to be pertinent QNM frequencies [Eq. 17], and are likely artifacts due to our simulation's containing nonzero power at frequencies beyond the resolvable limit. Comparison with public NINJA waveforms [55] reveals that these features show up inconsistently across NR implementations, which suggests that they are both spurious effects due to discretization, and independent of the dominant physics at play¹⁰.

As a result, we conclude that the fit errors in Fig. 4

⁹ These figures were calculated using the $\ell=m=5$ QNM frequency for an equal mass nonspinning BBC. In the same case, we find that there are ~ 111 points temporally and ~ 14 points spatially within the typical amplitude decay rate. Because QNM frequency decreases as final spin decreases, these numbers increase as the initial binary becomes more unequal (e.g. Fig. 2).

are not dominated by numerical artifacts, but instead primarily due to choice of representation: the spherical representation of Eq.(12), versus the spheroidal representation of Eq.(14). Kelly *et al* recently came to a similar conclusion by considering only the $(\ell, m) = (3, 2)$ spherical multipole.

III. MULTIMODE FITTING: FROM SPHERICAL TO SPHEROIDAL

As discussed in the previous section, the single-mode fitting of spherical multipoles, $\psi_{lm}^{\rm NR}$, results in relatively significant residual errors (greater than 5%) that are systematic in final BH spin. This spin-systematic behavior verifies the hypothesis encapsulated by Eq.(16): NR ringdown is not a single QNM, but a sum of QNMs. We are therefore motivated to pursue a multimode fitting approach to describe QNM excitations for different massratios. In particular, we will seek to extract spheroidal information from the spherical harmonic multipoles of NR waveforms.

By noting that the general fitting problem is multilinear in the set of decaying sinusoids given by perturbation theory [Eq.(16)], we present a method based upon ordinary linear least-squares fitting (OLS) to estimate spheroidal QNM amplitudes within each spherical multipole. We find that this particular choice of fitting routine (e.g. the least-squares approach used here) is not as important as its surrounding algorithm which aims to significantly reduce the problem's complexity. This is, in part, accomplished by utilizing a standard greedy algorithm in addition to OLS fitting. We refer to our approach as the greedy-OLS method.

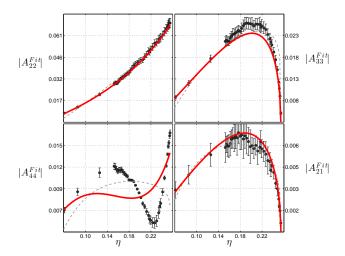
For reference, we test our method with artificial data within artificial numerical noise to present a brief comparison between our *greedy-OLS* method and the modified Prony method [50, 56] in Sec.III B. We then present estimates of the QNM excitations due to initially nonspinning BH binaries of variable mass ratio.

A. Multimode fitting method

We have developed and implemented the following fitting procedure to estimate QNM amplitudes:

- a. Given the set of ψ_{lm}^{NR} , we define ringdown to be the region $\{T_0 \leq t \leq T_1\}$ relative to the peak luminosity of $\psi_{2^{\mathrm{NR}}}^{\mathrm{NR}}$ [10]. Because the following procedure involves taking the discrete Fourier transform, each ringdown waveform is appropriately windowed at the noise floor, and padded to ensure consistent frequency domain resolution.
- b. Following Eq.(16), we assert that NR ringdown, $\psi_{l'm}^{NR}$, may be well approximated by sum of QNMs. As our numerical waveforms are of limited accuracy, we con-

¹⁰ Importantly, as will be discussed in Sec. III A, they are also well localized in the frequency domain, which allows us to effectively filter them out during multimode fitting.



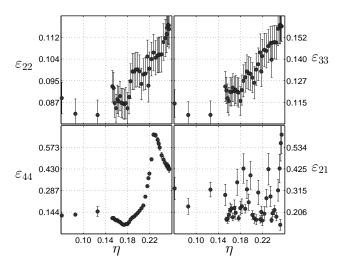


FIG. 4. Here we see the fundamental QNM excitations estimated by single-mode fitting. Left: The black dots are the excitation amplitudes estimated from fitting. For reference, the dashed grey lines are phenomenological fits from Kamaretsos et. al. [37], and the solid red lines are phenomenological fits from the more recent study by Meidam et. al. [54]. The error bars were calculated as described in Sec. III A- f. The right set of panels shows the related fractional residual errors calculated via Eq.(21).

sider this sum to be finite:

$$\psi_{\mathbf{j}}^{Fit}(t) = \sum_{k}^{N} A_{k}^{Fit} \, \sigma_{k\mathbf{j}} \, e^{i\tilde{\omega}_{k}t}$$

$$\approx \psi_{l'm}^{NR}$$
(22)

where

$$j \longleftrightarrow \{l', m\} \tag{23}$$

and

$$k \longleftrightarrow \{l, m, n\}.$$
 (24)

While Eq.(22)'s A_k^{Fit} is the estimate QNM amplitude, for notational simplicity we will henceforth refer to it as A_k . Moreover, the above summation is only over $\{l, l', n\}$, as m is fixed by Eq.(16).

Here, the apparent horizon may be used to estimate the BH's final mass and spin, M_f and $j_f = \frac{s_f}{M_f^2}$ [49]. Alternatively, one may estimate the final BH mass and spin by optimizing the multimode fit of a single $\psi_{lm}^{\rm NR}$, as each QNM frequency is determined by M_f and j_f (Appendix C). Specifically, the dependence of the QNM frequencies on M_f and j_f may be utilized by either direct calculation (e.g. [8]), as used here, or by phenomenological fit (e.g. [25])¹¹.

c. In the language of least-squares fitting, we seek to cast Eq.(22) in the form of a set of *normal equations*:

$$\alpha_{ij} = \sum_{k}^{N} \mu_{ik} \beta_{kj} \tag{25}$$

or equivalently,

$$\vec{\alpha}_{j} = \hat{\mu} \, \vec{\beta}_{j} \, . \tag{26}$$

To do so, we choose to make the following series of definitions:

$$\beta_{ki} \equiv A_k \, \sigma_{ki}$$
 (27)

$$\alpha_{ij} \equiv \frac{1}{\tilde{\omega}_i} \int_{T_0}^{T_1} e^{-i\omega_i t} \cdot \psi_j^{NR}(t) dt$$
 (28)

$$\mu_{ik} \equiv \frac{1}{\tilde{\omega}_i} \int_{T_0}^{T_1} e^{-i\omega_i t} \cdot e^{i\tilde{\omega}_k t} dt$$
 (29)

where $i \leftrightarrow \{l, m, n\}$ and $\hat{\mu}$ is an $N \times N$ complex valued matrix. The consistency of Eqs. (27)-(29) with Eq.(25) is evident upon plugging Eq.(22) into Eq.(28). If $\hat{\mu}$ is nonsingular, then the complex fitting amplitudes are given by

$$\vec{\beta}_{j} = \hat{\mu}^{-1} \vec{\alpha}_{j} . \tag{30}$$

Recalling that Eq.(27) defines $\vec{\beta}_{j}$ in terms of the complex QNM amplitudes, we equivalently have that estimates for the spheroidal coefficients in Eq.(22) are given by the kth element of $\vec{\beta}_{j}$

$$A_k \, \sigma_{kj} = (\vec{\beta}_j)_k = (\hat{\mu}_N^{-1} \, \vec{\alpha}_j)_k \, .$$

In effect, Eqs. (27)-(29) entail taking the Fourier transform of the ringdown waveform, and performing semianalytic, linear least-squares fitting in the basis of damped sinusoids allowed by perturbation theory.

This approach imposes that $\psi_{lm}^{\rm NR}$ be composed of the QNM frequencies of perturbation theory rather than

¹¹ We find these two approaches to nominally agree to within 1% of each other (Appendix C).

treating them as fitting parameters, and therefore, the total dimensionality of the fitting problem is reduced from $4 \times N$ to $2 \times N$: { $Re[\beta_{kj}]$, $Im[\beta_{kj}]$, N}. However, since Eq.(30) allows for the simultaneous determination of β_{kj} 's real and imaginary parts, the problem has effectively been reduced to $1 \times N$ dimensions. But note that the problem is not truly linear in N, as the fit must be optimized over all likely combinations of QNMs allowed by perturbation theory [Eq.(16)].

- d. To manage this last optimization, we first limit the set of allowed QNMs to those whose $\sigma_{l'lmn}$ is above $5\cdot 10^{-3}$ [Eq.(17)]. This choice is practically equivalent to only allowing l to differ from l' by at most 2, and simultaneously limits the largest allowed fitting frequency to be well below that of the non-QNM features discussed in Sec. II C. We then use a greedy 12 algorithm to estimate the optimal set of N QNMs for each ψ_{lm}^{NR} . We choose to guide the greedy process by using Eq.(21) averaged over different overlapping fitting regions 13 .
- e. Once the optimal set of QNMs has been found, we estimate the spheroidal QNM amplitudes from Eq. 27),

$$A_k = \frac{\beta_{kj}}{\sigma_{kj}} \,. \tag{31}$$

f. To quantify the effect 14 of T_0 on A_k , we perform the above process for $T_0 = \{6,7,8,..11,12\}(M)$ and then rescale each $A_k|_{T_0}$ using the corresponding QNM decay rate such that A_k is relative to $T_0 = 10(M)$. The resulting set, $\{A_k\}_{T_0}$, describes how much each recovered A_k agrees with our assumption that the choice of fitting regions corresponds to QNM dominated ringdown. For example, in the ideal case, where the fitting region contains only QNMs, every element $\{A_k\}_{T_0}$ would have the same value.

Throughout this paper, we describe the fitting region dependence of our results using error bars of width $\frac{1}{2}$ Range($\{A_k\}_{T_0}$), where Range($\{x_k\}$) = max($\{x_k\}$) - min($\{x_k\}$). In Fig. 4, a scaling factor of $\frac{1}{6}$ is used. Error bars for nonamplitude quantities have been calculated in a similar fashion. We choose to represent the error bars according to the range of values because the data of interest are inherently systematic, not random (Appendix B).

Now, for reference, we proceed by touching base with an alternative multimode approach of interest [50, 58], the modified Prony method [56].

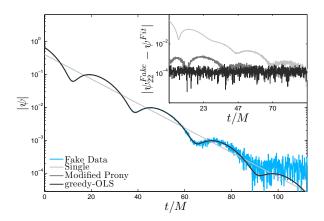


FIG. 5. Time domain comparison of different fitting methods for artificial multimode data.

B. Multimode fits

Before using the greedy-OLS algorithm developed in the preceding Sec., we compare it with a popular method for recovering damped sinusoids within noise that linearizes the fitting problem by framing each QNM as the root of a complex polynomial. If the number of data points is greater than the number of modes, this approach is called the modified Prony algorithm [50, 56]. In this Sec. we consider test data to demonstrate what we find to be the typical advantages of approaches like the the greedy-OLS algorithm. In particular, we ask: given fake data, ψ_{22}^{Fake} , of known QNM composition, which algorithm returns the input QNMs and achieves the best fit?

TABLE I. Recovered QNMs and errors when applying different fitting methods to artificial ringdown data composed of the $(\ell, m, n) = \{(2, 2, 0), (3, 2, 0), (2, 2, 1)\}$ QNMs within Gaussian noise. Residual errors were calculated using Eq.(21).

Method	Recovered QNMs (l, m, n)	ε
Single (Sec.II A)	(2,2,0)	6.00×10^{-1}
Modified Prony[56, 59]	(2,2,0),(3,2,0)	4.49×10^{-3}
Greedy-OLS (Sec.III A)	(2,2,0),(3,2,0),(2,2,1)	1.19×10^{-3}

To portray a typical answer to this question, we construct ψ_{22}^{Fake} to be composed of the $(\ell,m,n)=\{(2,2,0),(3,2,0),(2,2,1)\}$ QNMs with the addition of Gaussian noise[50] that is 10^{-5} times smaller than the largest component amplitude. As the modified Prony algorithm treats QNM frequency and decay time as free parameters, we label each output frequency by its nearest QNM frequency.

Figure 5 compares the output of the greedy-OLS method to the results of the modified Prony algorithm [56] and the single-mode fitting algorithm described in Sec.II A. Table I lists the recovered QNMs and corresponding residual errors (Eq.(21)). While both the modified Prony and greedy-OLS methods produce qualita-

¹² Our greedy algorithm builds a list of N QNMs by starting with N=1, and adding only QNMs to $\hat{\mu}_N$ that reduce the fit error (Eq.(21)). This process continues iteratively until the addition of at most two QNMs does not better the fit significantly, or causes the fit to become worse. A broader description of greedy algorithms may be found in [57].

¹³ In particular, we average ϵ_{lm} over 15 fitting regions whose starting time is equally spaced between T_0 and $T_0 + 20(M)$. Each ϵ_{lm} is calculated by evaluating Eq.(30) and Eq.(21) on the subregion.

 $^{^{14}}$ Please see Sec. V A for a somewhat expanded discussion.

tively precise fits, the inset of Fig. 5 shows that the Prony method incurs a noticeably higher residual error. Turning to Table I, we see that this larger residual error corresponds to the Prony method's not capturing the $(\ell,m,n)=(2,2,1)$ overtone. This missing mode illuminates two related disadvantages of Prony methods when applied to QNM analysis:

- a. The treatment of QNM frequency (Eq.(11)) as a free parameter increases the difficulty in assigning output frequencies to those predicted by perturbation theory.
- b. The method's output frequencies are susceptible to spurious deviations from the structure predicted by BH perturbation theory. This aspect of the algorithm complicates the process of estimating BH final mass and spin [25].

For these reasons, throughout the sections that follow, we favor the *greedy-OLS* algorithm. However, we must also note that any fitting algorithm that uses prior information from perturbation theory to perform multimode fitting may be just as effective. For example, we find that using the Levenberg-Marquardt algorithm[60], in place of Eq.(30), is just as potent at estimating the QNM terms in Eq.(22), but only if fitting frequencies are limited to those predicted by perturbation theory.

Now, with some confidence in the greedy-OLS method's faithfulness to the QNM content of ringdown data, let us consider two applications to NR ringdown. Figure 6 shows results for the l=m=2 (top row) and l=m=4 (bottom row) spherical multipoles of a 2:1 mass-ratio initially nonspinning BBH system. The four dots in Fig. 6's top left panel are the recovered QNMs for $\psi_{22}^{\rm NR}$, indicating that $\psi_{22}^{\rm NR}$ is dominated by four QNMs. Similarly, $\psi_{44}^{\rm NR}$ appears to be dominated by five QNM terms. As expected from single-mode fitting, the fundamental modes generally dominate. However, multimode fitting reveals overtones, and in the case of $\psi_{44}^{\rm NR}$, an apparent second order QNM. For reference, we have overlayed the results of the modified Prony method in Fig. 6's lower left panel.

Importantly, like our test case (Table I), the residual errors for these cases are ~ 10 times smaller than single-mode fitting. We find this to be generally true for initially nonspinning BBH systems of symmetric mass-ratio between 0.2500 and 0.0586. In the following section, we use these cases to peer into the new information captured by multimode fitting. We model the mapping between initial binary mass-ratio and QNM excitation.

IV. MAPPING QNM EXCITATION WITH SYMMETRIC MASS-RATIO

We apply the greedy-OLS algorithm to the ringdown of quasicircular initially nonspinning BBH systems of symmetric mass-ratio between 0.2500 and 0.0586. The result is a map between η and A_{lmn} . Just as in the case of inspiral, with its reflective symmetry about the orbital plane, we find that $|A_{lmn}| = |A_{l-mn}|$ for all systems considered; therefore, we only focus on the m > 0 multipoles.

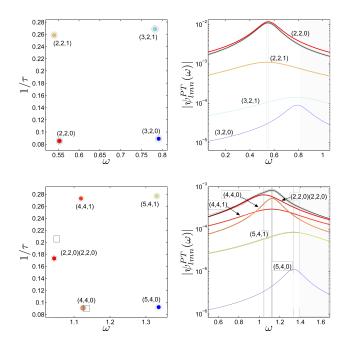


FIG. 6. Top Panels: multimode fitting results for ψ_{22}^{NR} . Bottom Panels: multimode fitting results for ψ_{44}^{NR} . Left: QNMs recovered, plotted in central frequency and decay time. Each point is labeled with its QNM index in (ℓ,m,n) format. Right: Frequency domain envelopes of component QNMs (color), NR data (grey), and total fit (black). Within each right panel, the shaded region denotes the frequency cut-off. Points in the left panels correspond to curves in the right panels of the same color and QNM label. For reference, we have overlayed the results of the modified Prony method in Fig. 6's lower left panel.

By applying the greedy-OLS algorithm to our NR ringdown, we are able to catalog the mass-ratio dependence of overtones and apparent second order QNM. We find that, for the initially nonspinning systems studied here, the mirror modes are not significantly excited.¹⁵ While many well-resolved QNMs are recovered, for practicality, we only focus on those needed to represent ψ_4 ringdown up to marginal accuracy. We consider these to be QNMs found within the dominant l=m and l=m+1 spherical multipoles (e.g. ψ_{lm}^{NR}), where $l \leq 4$ [37, 53, 61]. We go on to present a robust phenomenological model for the mapping between η and A_{lmn} . We start by touching base with current models for $A_{lmn}(\eta)$.

The phenomenological models proposed by [37] are shown in Fig. 4. This class of model is derived from the *single-mode* fitting approach mentioned in Sec.II, and only handles $|A_{lmn}|$ while leaving its complex phase to be matched to the phase of ψ_{lm}^{NR} after merger ¹⁶. While the model functions used in [37] capture the qualitative

 $^{^{15}}$ We will discuss in Sec. V that imposing these modes detracts from the consistency of our results with perturbation theory

¹⁶ On the other hand, a multimode representation of each $\psi_{l'm}^{NR}$ (Eq.(16)) requires information about both $|A_{lmn}|$ and its complex phase

behavior of the first few fundamental QNMs, the current study's increased resolution in mass-ratio reveals clear systematic deviations from NR results (Fig. 4, left panel). Most prominently, the local minimum in $|A_{440}|$ is not captured by

$$|A_{440}| = a |\tilde{\omega}_{440}|^2 \left(\frac{\mathrm{m}_1}{\mathrm{m}_2}\right)^{\frac{3}{4}} e^{-b \frac{\mathrm{m}_1}{\mathrm{m}_2}}.$$

The more recent work of [19] focuses on the (l, m, n) = (3, 2, 0) mode, and proposes a qualitatively precise model for $|A_{320}(\eta)|$,

$$|A_{320}| = \sqrt{(a - b e^{-\lambda/\eta})^2 + c^2},$$
 (32)

where a, b, c, and λ are real valued constants. Despite the success of this map¹⁷, it is not immediately clear why this functional form works so well, and how its effectiveness may be extended to the other QNMs.

Ultimately, a thorough analytic study of QNM excitation, akin to [41], may be needed to *derive* the mapping between η and A_{lmn} . While such a pursuit is beyond the current study, a connection between $A_{lmn}(\eta)$ and known physics is appropriate.

To approach this problem, we maintain that QNM excitations are, like their PN counterparts, best described by an expansion in the initial binary's parameters. Here we expand upon [31] by considering a beyond leading order summation in symmetric mass-ratio.

First, we note that the relevant ¹⁸ PN *strain* multipole moments may be written in the form

$$h_{lm} = \eta e^{-im\phi(t)} \delta_m(m_1, m_2) \sum_{u=0}^{\infty} b_u \eta^u$$
 (33)

where

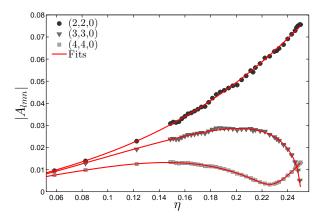
$$\delta_m(\mathbf{m}_1, \mathbf{m}_2) \equiv \frac{|\mathbf{m}_1 + (-1)^m \mathbf{m}_2|}{\mathbf{m}_1 + \mathbf{m}_2}$$

$$= \sqrt{1 - 4\eta}$$
(34)

and ϕ is the time dependent part of the waveform's complex phase [62, 63]. In seeking to generalize Eq.(33) to ψ_4 QNM excitations, we may begin by expecting that during ringdown, $\phi(t)$ becomes $\phi_{lmn} = \tilde{\omega}_{lmn}t + constants$ (we revisit this idea in Sec. IV A). Furthermore, since ψ_4 and strain are related through two time derivatives, the ψ_4 ringdown analogue of Eq.(33) would pick up a factor of

$$\tilde{\omega}_{lmn}^2 = |\tilde{\omega}_{lmn}^2| e^{-2\varphi_{lmn}} .$$

Lastly, rather than Eq.(33)'s overall scaling by η , we find it useful to impose that the excitation of each nth overtone be proportional to η^n .



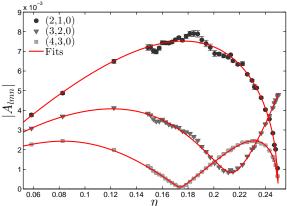


FIG. 7. Fundamentals. The error bars were calculated as described in Sec. III A- f.

Gathering all of these ideas, we propose that, for ψ_4 QNM excitations, Eq.(33) generalizes to

$$A_{lmn} = \tilde{\omega}_{lmn}^2 \, \delta_m(\mathbf{m}_1, \mathbf{m}_2) \, \eta \sum_{u=0} a_u \, \eta^u$$

$$= e^{-i\phi_{lmn}} \, |A_{lmn}|$$
(35)

where

$$\phi_{lmn} \equiv \vartheta_{lmn} + 2\,\varphi_{lmn} \tag{36}$$

and

$$a_u = |a_u|e^{i\alpha_u} \ . \tag{37}$$

While we have chosen to encapsulate the intrinsic α_u contribution (Eq.(37)) within ϑ_{lmn} , one might also expect additional extrinsic contributions to ϑ_{lmn} from the construction of each simulation (e.g. initial binary separation) [52]. Our approach to these dependencies is outlined in Sec.IV A.

We also notice that our PN inspired model has the immediate advantage of constraining the QNM amplitudes to be zero in the extreme mass-ratio limit, $\eta \to 0$, while imposing that only even m QNMs are excited in the equal-mass case where $\delta_m=0$. As a more phenomenological point, we have chosen to model the overtone dependence as an increasing proportionality in η to better fit the NR data.

 $^{^{17}}$ Please see Fig. 10 of [19].

¹⁸ nonspinning, non-precessing, quasicircular compact binaries.

With these conceptual tools at hand, we may now apply Eq.(35) to NR ringdown by constructing a fit for the complex valued A_{lmn} , as a function of η .

A. Constructing a fit for A_{lmn} on η

In order to accurately model ringdown according to Eq.(14), both $|A_{lmn}|$ and the overall phase, ϕ_{lmn} must be represented. To do so, let us start by focusing on the aspects of Eq.(35) not given by perturbation theory. First, we rearrange Eq.(35) to define

$$C_{lmn} \equiv \frac{A_{lmn}}{\eta^{1+n} \tilde{\omega}_{lmn}^2 \delta_m(\mathbf{m}_1, \mathbf{m}_2)}$$

$$= \sum_{u=0} a_u \eta^u .$$

$$= |C_{lmn}| e^{i \vartheta_{lmn}}$$
(38)

As we expect C_{lmn} to be a polynomial with complex coefficients, it might be well captured by standard least-squares fitting methods; however, we are wary that this approach will be ineffective if ϑ_{lmn} is not dominated by the phase of the polynomial sum¹⁹.

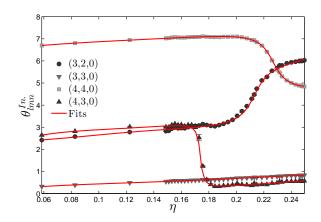


FIG. 8. Examples of phases relative to $m\phi_{22}/2$.

With this in mind, if we refer to the intrinsic polynomial phase as ϑ_{lmn}^{In} , and the additional extrinsic contribution as ϑ_{lmn}^{Ex} , then

$$\vartheta_{lmn} = \vartheta_{lmn}^{Ex.} + \vartheta_{lmn}^{In.} . \tag{39}$$

Physically, if there is a preferred azimuthal direction postmerger, then one might expect it to dominate ϑ_{lmn}^{Ex} .

In practice, we find this preferred direction is set by the kick velocity. For the simulations considered here, the kick velocity is always within the orbital plane of the initial binary, giving $\vec{v}_{kick} = v_x \hat{x} + v_y \hat{y}$. The direction of the kick velocity with respect to the simulation frame is then $\phi_{kick} = \tan^{-1}(v_y/v_x)$. In this sense, we find that the extrinsic part of C_{lmn} 's complex phase is given by

$$\vartheta_{lmn}^{Ex.} = m \left(\phi_{kick} + \phi_0 \right). \tag{40}$$

Together with Eq.(39) and Eq.(36), we now have that

$$\phi_{lmn} = \vartheta_{lmn}^{In.} + m(\phi_{kick} + \phi_0) + 2\varphi_{lmn}. \tag{41}$$

Note that changes in the line of sight about the BH's final spin direction affect ϕ_{lmn} and $m \phi_{kick}$ in the same way. Put differently, redefining Eq.(13)'s to be $\phi = \phi' - \delta \phi$ effectively adds $m\delta \phi$ to both sides of Eq.(41). This leaves Eq.(41)'s ϕ_0 as an orientation independent quantity (e.g. independent of the observer's location in the initial binaries orbital plane).

However, ϕ_0 is not purely intrinsic. As we have written it in Eq.(41), ϕ_0 not only encapsulates the difference between the final kick orientation and QNM phase, but also how each QNM's phase has evolved up to the start of the fitting region, $t_* = T_0$. This is discussed further in Sec. V A.

Using the (l, m, n) = (2, 2, 0) QNM, we find that

$$\phi_0 \equiv \frac{\vartheta_{lmn}^{Ex.}}{m} - \phi_{kick} \approx \frac{\phi_{220}}{2} - \phi_{kick} . \tag{42}$$

This gives $\phi_0 = -2.39 \pm 0.10$ rad. The regularity of approximation across different mass-ratios is briefly discussed in Sec. V C.

Together, Eqs. (36)-(42) reveal the intrinsic polynomial phase to be

$$\vartheta_{lmn}^{In.} \approx \phi_{lmn} - (2\varphi_{lmn} + m(\phi_{kick} + \phi_0))$$

$$\approx \phi_{lmn} - (2\varphi_{lmn} + m\frac{\phi_{220}}{2}).$$
(43)

We may therefore construct C_{lmn} by evaluating Eq.(43), and applying it to the magnitude of $|C_{lmn}|$ given by Eq.(38). This allows for the *simultaneous* least-squares fitting of C_{lmn} 's magnitude and phase. Here we have used MATLAB's polyfit.m. By increasing the order of the polynomial fit until the residual error [Eq.(21)] changes by less than 10%, we find that C_{lmn} are well fit by polynomials of order $\ell-1$ for the considered range of η . Figure 7 displays the broad effectiveness of our fitting C_{lmn} , and then transforming back to A_{lmn} to calculate $|A_{lmn}|$. Similarly, Fig. 8 displays the corresponding intrinsic phases and their fits.

For each local minimum in Fig. 7, there is a corresponding phase transition in Fig. 8. In an approximate sense, this suggests that each C_{lmn} may be more appropriately represented as a polynomial function of $(\eta - \eta_0)$, which would force $\eta = \eta_0$ to be a local minimum. However, for simplicity, we have tabulated all fitting coefficients according to Eq.(38).

All fitting coefficients are given in Appendix A.

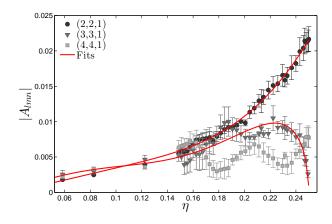
¹⁹ For simplicity, we will not separate the Kerr eigenvalues (e.g. the excitation factors [64]) out from the net QNM excitation, A_{lmn} . The result is that the polynomial in question approximates the product of two functions. One, the excitation factor, is independent on the initial parameters. The other is entirely dependent on the initial parameters.

B. Beyond the fundamentals: overtones & second order modes

Figure 9 displays estimates for the QNM amplitudes of overtones (top panel) and second order modes (bottom panel) as recovered by the greedy-OLS algorithm. While their existence has been discussed in previous studies (e.g [16, 18, 21–23, 33–36]), we present for the first time their characterization with symmetric mass ratio.

The fitting polynomials for the overtones were found to be of order l-1 in η . The (l,m,n)=(4,4,1) case is a clear exception, requiring at least an eighth order fit. While we find that many of our estimates of $|A_{lmn}|$ display a localized increase between $0.18 \geq \eta \geq 0.17$, $|A_{441}|$ displays a significant decrease which makes its η dependence possibly inconsistent with Eq.(35). As discussed in Sec.V A, this is likely due to the definition of ringdown start time in terms of the initial rather than final mass scale.

Given the limitations of our NR runs, we consider these oscillations to be numerical, rather than physical. A similar oscillating trend is observed in the apparent $(l_1, m_1, n_1)(l_2, m_2, n_2) = (2, 2, 0)(2, 2, 0)$ excitation (Fig. 9). We discuss the likely source for these oscillations in the next section (Sec. V C).



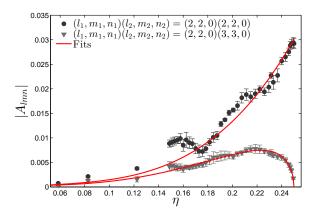


FIG. 9. Estimated overtone (Top) and second order (Bottom) excitation amplitudes via multimode fitting. The error bars were calculated as described in Sec. III A- f.

While the overtones decay faster (e.g. Fig. 6), their functional form largely mirrors their n=0 counterparts (Fig. 7). Similarly, the functional form of the second order modes appears consistent with the notion that each second order mode is largely driven by products of two first order modes [34]. Quantitatively, we expect that each $A_{(l_1m_1n_1)(l_2m_2n_2)}$ should be proportional to the product of some $A_{l_1m_1n_1}$ and $A_{l_2m_2n_2}$

$$A_{(l_1m_1n_1)(l_2m_2n_2)} \propto A_{l_1m_1n_1} A_{l_2m_2n_2}$$
 (44)

Under this caveat, we model the second order modes according to

$$A_{(l_1m_1n_1)(l_2m_2n_2)} = \mu_{(l_1m_1n_1)(l_2m_2n_2)}$$

$$\times A_{l_1m_1n_1} A_{l_2m_2n_2} ,$$
(45)

where, given $A_{l_1m_1n_1}$ and $A_{l_2m_2n_2}$ from the first order fits, $\mu_{(l_1m_1n_1)(l_2m_2n_2)}$ is the only undetermined parameter

Upon using a standard root finding algorithm to solve for $\mu_{(l_1m_1n_1)(l_2m_2n_2)}$, we find qualitatively good agreement between our raw estimates for $A_{(l_1m_1n_1)(l_2m_2n_2)}$ and Eq.(45). While Fig. 9 displays $(l_1m_1n_1)(l_2m_2n_2) = (2,2,0)(2,2,0)$ and (2,2,0)(3,3,0) cases, other less dominant and poorly resolved candidates were detected.

All fitting coefficients are given in Appendix A.

V. CONSISTENCY WITH PERTURBATION THEORY AND RESULT LIMITATIONS

While we have developed a method for the estimation of QNM excitation coefficients, this alone does not guarantee the consistency of our results with perturbation theory. This is primarily due to the fact that the QNMs and their related functions are not complete (e.g. [65]). In particular, the decaying sinusoids are overcomplete, making it, in principle, possible to achieve an arbitrarily good fit to Eq.(16) with many different combinations of decaying sinusoids. However, the effectiveness of the greedy-OLS method described in Sec. III hinges not on the completeness of the QNMs, but on the uniqueness of the Fourier transform (Eq.(28)), which the algorithm seeks to approximate up to numerical accuracy by focusing only on the sparse QNM frequencies suggested by perturbation theory²⁰.

Even so, results for A_{lmn} may be intrinsically biased if the data are not actually dominated by QNMs. This is the case if the fitting region is chosen either too close to the merger regime, or so far away that irregular numerical noise dominates. For this reason, independent measures of the $|A_{lmn}|$'s consistency with perturbation theory are needed. In this section we consider two such measures, and discuss the limitations of our results.

The greedy-OLS algorithm uses only a handful of frequencies to estimate the Fourier Transform at all frequencies. We find that applying the greedy-OLS algorithm with the QNM frequencies corresponding to a different physical spin does not yield good

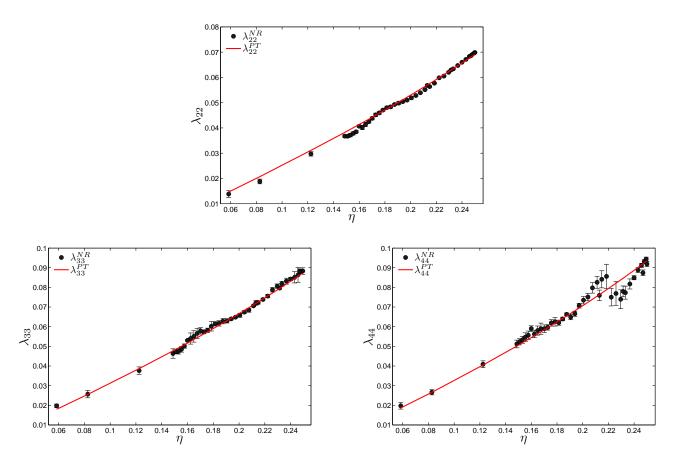


FIG. 10. Top, bottom left, right: Ratio of inner-products between spherical and spheroidal harmonics estimated via multimode fitting and direct calculation. The error bars were calculated as described in Sec. III A- f.

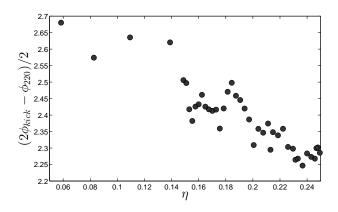


FIG. 11. Difference between phase of (l, m, n) = (2, 2, 0)QNM excitation (10 M after the peak luminosity in ψ_{22}^{NR}) and the scaled kick direction, $m\phi_{kick}$ (Sec.IV).

A. Fitting region effects

The first estimate of consistency is mentioned at the end of Sec. III A-f: the effect of ringdown start time, T_0 , on A_{lmn} . Here we will discuss the effect of T_0 on A_{lmn} from two perspectives.

Changing Scales.— On one hand, we may ask why defining T_0 relative to the peak luminosity of $\psi_{22}^{\rm NR}$ has

been found to yield well-behaved maps between initial binary parameters and QNM excitations. For example, if one defines T_0 relative to the peak of $\psi_{22}^{\rm NR}$ rather than its luminosity, then seemingly irregular oscillations are introduced into the dependence of each fundamental mode's A_{lmn} on symmetric mass-ratio. This suggests that there is something about the peak luminosity that serves as a consistent reference for how the system is evolving in the ringdown regime. This postulate is supported by our analysis of each A_{lmn} phase in Sec. IV, where we found that when using the peak luminosity as a reference point, the complex phase of each A_{lmn} was dependent on m time the systems final kick direction with an offset of $m\phi_0$ that is largely independent of initial parameters (Eq.(43)). This means that the phase evolution of each ringdown waveform, relative to the time of the peak luminosity, is approximate for the systems considered here. In other words, the choice to measure time relative to the peak luminosity appears to be approximately the same as choosing T_0 such that ϕ_0 is constant.

However, there is a discrepancy here: we have chosen $T_0 = 10M$ in units of the system's Arnowitt-Deser-Misner (ADM) mass [38], not the final black hole mass M_f , meaning that while the physical scale of the system (M_f) changes, our reference length T_0 stays fixed. This along with the dependence of each QNM frequency on the final system state, $\{M_f, j_f\}$, should contribute to

a systematically varying ϕ_0 . The systematic dependence of ϕ_0 is shown in Fig. 11 against η (η is proportional to j_f).

As with choosing the peak of ψ_{22}^{NR} rather than its luminosity as a reference point, we might expect seemingly irregular oscillations to appear in the dependence of some $|A_{lmn}|(\eta)$. In particular, while further study is needed, the above argument is a likely explanation for the fluctuations of some modes around $\eta = 0.18$ (e.g. $|A_{320}|$ and $|A_{210}|$ in Fig. 7, and the modes in Fig. 9).

Different Start Times.— On the other hand, different fitting regions incur different amounts of numerical noise which may bias results. Therefore we have chosen to quantify this measurement error by considering different fitting regions, and then rescaling our results to be relative to $T_0 = 10\,M$ after the peak in $\psi_{22}^{\rm NR}$'s luminosity. This measure of consistency answers the question "How much does the recovered QNM behave like a damped sinusoid?" and may be quantified by rescaling $A_{lmn}|_{T_0}$ according to its complex QNM frequency

$$A_{lmn}|_{T_0} \approx A_{lmn}|_{T_0'} e^{i\tilde{\omega}_{lmn} (T_0 - T_0')}$$
 (46)

In the ideal case, where the estimated A_{lmn} behaves exactly as a decaying sinusoid from T_0 to T'_0 , Eq.(46) becomes an equality. This method was utilized to make the error bars throughout this paper.

While we find that the effects of choosing different T_0 are inherently systematic²¹, they are also indicative of an optimal start of ringdown that is generally about 10M after the peak luminosity in $\psi_{22}^{\rm NR}$ (Appendix B); however, in some cases the effective ringdown fitting may be performed up to 2M after the peak luminosity. An expanded description of fitting region effects is given in Appendix B.

B. Inner-product ratios

An additional consistency test may be performed by taking advantage of Eq.(16) for different $\psi_{lm}^{\rm NR}$ [19]. Noting that any QNM may be found within multiple $\psi_{lm}^{\rm NR}$ of the same m, it follows that the ratio of their mixing coefficients may be estimated from fitting results, and then compared to analytic calculations via Eq.(17).

For example, in the case of $\psi_{33}^{\rm NR}$ and $\psi_{43}^{\rm NR}$, Eq.(16) gives that

$$\psi_{33}^{NR}(t) = A_{330} \, \sigma_{3330} \, e^{i\tilde{\omega}_{330}t} + \dots$$

and

$$\psi_{43}^{\text{NR}}(t) = A_{330} \,\sigma_{4330} \,e^{i\tilde{\omega}_{330}t}$$
$$+ A_{430} \,\sigma_{4430} \,e^{i\tilde{\omega}_{430}t} + \dots$$

By comparing terms, and recalling that the *greedy-OLS* algorithm gives a measure for terms in the above sum via

Eq.(27)

$$\beta_{l'lmn} = A_{lmn}^{Est.} \sigma_{l'lmn}^{Est.}$$

we see that the ratio, $\sigma_{l'lmn}/\sigma_{llmn}$ may be estimated directly from the results of multimode fitting. For brevity, we shall limit our discussion to the fundamental modes. For clarity, we will make a distinction between the perturbation theory result derived from Eq.(17)

$$\lambda_{l'm}^{\rm PT} = \frac{\sigma_{l'lm0}}{\sigma_{llm0}} \,, \tag{47}$$

and the multimode fitting estimate

$$\lambda_{l'm}^{NR} = \frac{\beta_{l'lm0}}{\beta_{llm0}}
= \frac{\sigma_{l'lm0}^{Est.} A_{lm0}^{Est.}}{\sigma_{llm0}^{Est.} A_{lm0}^{Est.}} .$$
(48)

The three panels of Fig. 10 compare $\lambda_{lm}^{\rm NR}$ to $\lambda_{lm}^{\rm PT}$ for $l=m=\{2,3,4\}$. Because $\lambda_{lm}^{\rm NR}$ is insensitive to waveform phase, we have included results for three waveforms with lower symmetric mass-ratios.

While consistency between perturbation theory and our numerical results is seen in all cases, our estimate $\lambda_{44}^{\rm NR}$ does systematically deviate from $\lambda_{lm}^{\rm PT}$ by roughly 10% on $0.20 < \eta < 0.25$. As suggested by our discussion in Sec. II C, we consider this deviation to be the result of $|A_{440}|$ approaching the magnitude of numerical noise. Moreover, this deviation was found to be exacerbated by the addition of mirror modes(Sec. IB), the removal of the second order modes, or both.

C. Limitations of results

While finite spatial and temporal NR resolution limits the frequencies and multipoles that we are able to consider, we find that our results are stable with respect to the resolutions discussed in Sec. II C. This also suggests that gauge and near-field effects are not significantly manifested for the majority of our results²². However our consideration of the apparent second order modes carries a more basic limitation: we currently lack detailed knowledge about their structure. Moreover, our lacking many simulations in the very unequal mass-ratio regime presents another limitation.

Second Order Modes.— As analytic calculations of second order Kerr QNMs are lacking, there exists a tension in the existing literature.

On one hand, analytic studies such as that of Ioka and Nakano [34] suggest that second order perturbations result in QNMs proportional by products of two first order modes. On the other hand, Pazos *et al* [35] found that, for spherically symmetric initial data, scalar wave scattering off of a Schwarzschild black hole results in second

²¹ To the left of ringdown is the nonlinear merger, and to the right is numerical noise.

 $^{^{22}}$ See [19] for an expanded discussion.

order excitations whose frequencies are the same as those of first order modes.

In this study (Sec. IVB) we find second order excitations that appear to be largely driven by two first order QNMs, with frequencies that are sums of two first order frequencies. However, as our analysis approach has been designed to only extract spheroidal information post-merger, it cannot directly untangle mode coupling effects that would be consistent with [35]. Therefore, our findings may indeed be consistent with both [35] and [34]. We expect that an analytic study, analogous to Leaver's work [8], but for second order Kerr perturbations [32], may elucidate the matter.

Among the subtleties that should be addressed, we expect the degeneracy of the sum and difference tone spectrum to play an important role: when considering the entire set of possible second order modes, one quickly finds exact or near degeneracies between QNM frequencies with $l_1 \neq l_2$ and $m_1 \neq m_2$. Here, the second order modes with the lowest l = m indices, such as (2,2,0)(2,2,0) and (2,2,0)(3,3,0), are not only free from degeneracy at this level, but appear to be the most prominent.

On a more rudimentary note, we do caution that, for the apparent second order modes discussed in Sec. IV B, the overall proportionality constants (see Appendix A) are surely biased by the numerical limitations discussed in this and previous sections.

Very unequal mass-ratios.— Lastly, in regards to our fits for QNM excitation on symmetric mass-ratio, a more basic limitation is the inability to include many points in the very unequal mass-ratio regime ($\eta < 0.15$). Therefore, while the fits presented in Sec. IV have been constructed to adhere to the extreme mass-ratio limit, they are, conservatively, only valid within the presented range of η .

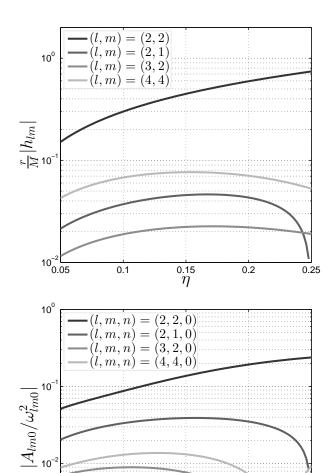
VI. DISCUSSION OF RESULTS

In this section, we comment on the potential relevance of subdominant QNMs to ringdown templates and the relevance of our results to perturbation theory.

Perturbation theory comments

Pending an analytic description of QNM excitation for initially nonspinning, quasicircular BBH merger, akin to [41], and a better understanding of the higher order Kerr spectrum, akin to [67], we have found that a PN-like prescription effectively models QNM excitation for the systems studied. The success of this model suggests that a well-defined analytic description exists, and that its predictions may be directly compared to the fitting coefficients in Equations (2-10). When directly compared to its PN counterparts, our model also illuminates the qualitative differences between the inspiral regime, where PN is valid, and the postmerger ringdown regime.

In particular, Fig. 12 shows the qualitative differences between the spherical multipolar GW emission predicted



 $\eta^{0.15}$ FIG. 12. Comparison of the PN strain amplitudes with QNM amplitudes. Top: Amplitude of dimensionless Post-Newtonian strain for a selection of (ℓ, m) spherical multipoles. Values were calculated at $M\omega = 0.18$ using reference [66]. Bottom: Amplitude only fits for fundamental QNM excitations.

0.2

0.25

10

0.05

0.1

by PN (top panel), and the fundamental spheroidal emission (bottom panel) presented here. On one hand, similarities between the $(l, m, n) = \{(2, 2, 0), (2, 1, 0)\}$ QNMs and their PN counterparts may suggest that they are connected by a largely linear process. On the other hand, the clear differences between PN predictions, and the (l, m, n) = (3, 2, 0) and (4, 4, 0) QNMs may suggest a region of nonlinear response between $\eta = 0.1$ and $\eta = 0.24$. Further study is needed to precisely clarify whether or not this is the case.

Despite our current limited understanding of the underlying physics, the local minima seen in Fig. 12 suggest that the (l, m, n) = (3, 2, 0) and (4, 4, 0) QNMs are less likely to be relevant for detection in the \sim 2:1 mass-ratio $(\eta \approx 0.22)$ regime. This point, in addition to our descrip-

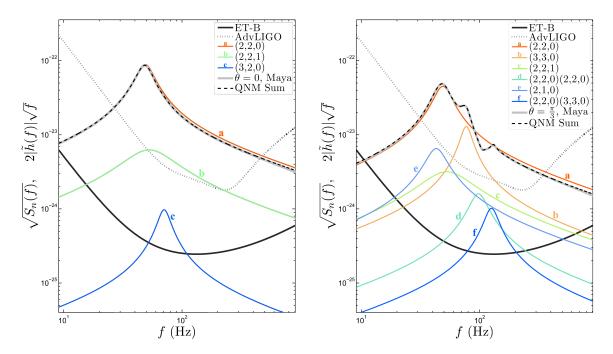


FIG. 13. Frequency domain envelopes of strain and fitted QNM amplitudes for a 2:1 mass-ratio system ($\eta=0.22$) of 350 M_{\odot} , at a distance of 100 Mpc. Left: Signal for line of sight along final spin direction (e.g. (θ,ϕ) = (0,0)). Right: Line of sight $\pi/3$ rad with respect to final spin direction, (θ,ϕ) = ($\pi/3$,0). Noise curves for the Einstein Telescope and Adv. LIGO are shown for reference. For each panel, the color of each quasinormal mode curve, along with its relative position, label the mode's contribution to total signal to noise ratio. In each case, the (l,m,n) = (2,2,0) mode is the most dominant.

tions of the overtones and second order modes (Sec. IV), allows us to make qualitative comments on the relevance of QNMs to template accuracy and mode detectability.

B. Template comments

While template accuracy and mode detectability are topics whose full treatment is beyond the current work, we are able to briefly comment on the impact of subdominant QNMs on the signal to noise ratio (SNR) of ringdown signals. To do so, we will reconsider the 2:1 mass-ratio binary discussed in the introduction (Fig. 1).

Specifically, let us contemplate an idealized scenario where a ringdown-only template is being used to search for a potential signal as observed by either the Einstein Telescope (ET), or Advanced LIGO (Adv. LIGO). For simplicity we will assume that either detector is equally sensitive over the solid angle, and that there are no glitches in detector sensitivities as presented in Refs. [3, 4]. To completely constrain our example, we will consider only templates made with binary parameters identical to that of the signal: final mass $350~M_{\odot}$, at a distance of 100 Mpc, initially nonspinning, $\eta = 0.22$, and quasicircular. We are only interested in the effect of subdominant QNMs on the estimated SNR.

If the signal, $\tilde{s}(f)$, is the frequency domain counterpart of Fig. 1's waveform, and the template, $\tilde{h}(f)$, is composed of some superposition of QNMs according to the Fourier transform of Eq.(14), then the SNR is given

by

$$\rho = \frac{(\tilde{s}(f)|\tilde{h}(f))}{\sqrt{(\tilde{h}(f)|\tilde{h}(f))}}$$
(49)

where

$$(a(f)|b(f)) \equiv 2 \int_{-\infty}^{\infty} \frac{a^*(f)b(f)}{S_n(f)} df$$
 (50)

and S_n is the power spectral density (PSD) of the detected noise [3, 4, 68].

In the best case scenario, where the signal and template are identical, ρ takes on its maximal value, ρ_{max} . Table II lists the values of ρ_{max} for the orientations shown in Fig. 1.

TABLE II. Maximal SNR values, ρ_{max} , for ET and Advanced LIGO (Adv. LIGO) detectors at two different orientations with respect to the final BH's spin direction: $(\theta, \phi) = \{(0,0), (\pi/3,0)\}$. Final mass 350 M_{\odot} , distance 100 Mpc, initially nonspinning, $\eta = 0.\overline{22}$, quasicircular.

ſ	(θ,ϕ)	$ ho_{max}$			
		Adv. LIGO	ET		
	(0,0)	10.58	160.79		
	$(\pi/3, 0)$	6.20	94.29		

We now ask which QNMs contribute the most to the total SNR for each of the cases above. To answer this

question, we sequentially determine which N-mode template recovers the largest percent of ρ_{max} . For example, if we denote the recovered SNR of each N-mode template to be ρ_* , then in the case of Adv. LIGO, the 1-mode template that recovers the largest percentage of ρ_{max} contains only the (l,m,n)=(2,2,0) QNM. This is the case for $\theta=0$, where $\rho_*=0.9986\rho_{max}$, and for $\theta=\pi/3$, where $\rho_*=0.9749\rho_{max}$. If we ask which additional QNM results in the largest ρ_* at $\theta=\pi/3$, then (3,3,0) proves to be the next most important, with $\rho_*=0.9837\rho_{max}$. Taking another step forward, we find that the best 3-mode template for Adv. LIGO at $\theta=\pi/3$ includes the (2,2,0), (3,3,0) and (2,2,1) QNMs, with an SNR of $\rho_*=0.9902\rho_{max}$.

TABLE III. Recovered QNMs and estimated fractional SNR values for Advanced LIGO (Adv. LIGO) and the Einstein Telescope. Under each detector heading, values for the SNR found using only one mode, ρ_1 , and values for using many modes, ρ_* , are shown. In the case of ρ_* , the number of QNMs used in the template increases from top to bottom. This may be seen in the first row of each case, where $\rho_* = \rho_1$.

(θ, ϕ)	Mode	Adv. LIGO		ET	
	(l, m, n)	ρ_1 (%)	ρ_* (%)	$\rho_1 \ (\%)$	ρ_* (%)
	(2, 2, 0)	99.865	99.865	99.880	99.880
(0,0)	(2, 2, 1)	89.461	99.986	86.956	99.989
	(3, 2, 0)	62.561	99.997	59.026	99.998
	(2, 2, 0)	97.494	97.494	98.348	98.348
	(3, 3, 0)	63.946	98.365	60.932	98.801
$(\frac{\pi}{3}, 0)$	(2, 2, 1)	86.457	99.023	85.537	99.349
	(2, 1, 0)	41.464	99.558	92.670	99.685
	(2,2,0)(2,2,0)	92.069	99.795	40.896	99.886
	(2,2,0)(3,3,0)	30.870	99.934	27.192	99.957

Table III lists the percentages of ρ_{max} recovered up to the 6-mode template for $\theta = \pi/3$ and up to the 3-mode template for $\theta = 0$. Figure 13 is a graphical representation of Table III, and displays each frequency domain QNM against the ET and Adv. LIGO PSDs.

This simple numerical experiment suggests that the greater the angle between the detector's line of sight and the BH's final spin direction, the more QNM information is needed to model the signal up to 99% of ρ_{max} . While the orientation dependence and impact of multipoles with l>2 on detectability is a topic of active interest [61, 69, 70], and previous studies of adding fundamental QNMs of $\ell>2$ to ringdown-only templates have suggested a significant effect on event loss [28, 31], our example demonstrates that the (l, m, n) = (2, 2, 1) overtone may play a meaningful role. Further study, similar to [31], is needed to better quantify its significance.

Intriguingly, although Table III shows that the second order QNMs may only add a minuscule amount to the total SNR, their contribution to the frequency domain features in Fig. 13 raises the possibility of their being identified postdetection.

Finally, in light of the QNM amplitude and phase results presented in Sec. III B, our toy example also allows us to consider what information about the remnant BH

may be learned. It is well known that the scaling of QNM frequencies with remnant mass means that the detection of at least two QNM frequencies is required to estimate the final mass and spin of the system [25, 27, 31, 38, 71]. This information, along with the relative amplitudes may also yield information about the initial binary, and perhaps even final spin orientation [37, 38]. Of the current study, if two QNM frequencies are detected, allowing for the identification of each frequency's (l, m, n), then a rearrangement of Eq.(42) suggests that information about the recoil angle relative to the line of sight may also be estimated via

$$\phi_{kick} \approx \frac{\phi_{220}}{2} - \phi_0 . \tag{51}$$

The applicability of this potential measure is the subject of a future study.

VII. CONCLUSION

Our in-depth analysis of NR entrance into ringdown has provided us with a wealth of information about the excitation of QNMs. We have found evidence for nonfundamental spheroidal QNM excitations within the residuals of single-mode QNM fits (Sec. IIB). By developing a method to estimate these spheroidal components (Sec. IIIA), we have presented a review of QNM excitations including and beyond the fundamentals, and we have discovered that the phase of these excitations is affected by the remnant BH's final kick direction (Sec. IV A).

QNM excitations are well modeled by a PN-like expansion (Sec. IV), and that our estimates for the excitation amplitudes are largely consistent with perturbation theory, within the limits of knowledge and numerical accuracy available at the time of this study (Sec. V).

To make our results available for the construction of ringdown related GW templates, we have tabulated related fitting coefficients in Appendix A.

We studied the relevance of our results for GW detection with the ringdown of a 2:1 mass-ratio system of initially nonspinning BHs. For this case, we find that the $l=m=2,\ n=1$ overtone is the most dominant, and that that it is the second most significant QNM when the remnant BH is observed along its final spin axis (Fig. 13 left panel). This case also demonstrates that the apparent l=m=2 second mode, while minuscule in comparison to its first counterpart, may be more significant than higher l QNMs at similar frequencies (Fig. 13 right panel). Moreover, this case is consistent with the expectation that as the line of sight deviates from the final BH spin direction, more QNMs are needed to accurately represent the signal (Table III).

But as informative as our example 2:1 mass-ratio system may be, its shortcoming are clear. It demonstrates that when modeling ringdown the (l, m, n) = (2, 2, 1) can play a role comparable to that of the higher fundamental QNMs (Table III), but to solidify this statement, and it's relevance to high mass templates, a full orientation study

is needed. We have also seen that apparent second order QNMs might contribute to ringdown's frequency domain features (Fig. 13), but the full extent to which these modes are relevant cannot be assessed without more accurate NR simulation, and a better understanding of the second order structure of Kerr perturbations. Intriguingly, we have also seen that QNM phase carries information of how the remnant BH is oriented relative to its recoil velocity. While our example system demonstrates that this might allow for an estimation of the recoil direction relative to the line of sight, the scope of the estimation as presented here is only a first step. We look forward to the exploration of this possibility in future work.

VIII. ACKNOWLEDGMENTS

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Appendix A: Fitting Coefficients for QNM Excitations

For convenience, here we have collected all fitting formulas and related coefficients. In particular, if one is interested in the QNM excitations from initially nonspinning, quasicircular binary black hole coalescence, then we present the following algorithmic description to apply the model presented in Sec. IV. For additional convenience, a basic usage and plotting example has been made available in reference [?].

The primary inputs of our model are the binary's component masses, m_1 and m_2 . The primary output of our model is the ringdown portion $\psi_4(t)$, starting 10 (M) after the peak luminosity in the l=m=2 spherical multipole. Therefore, throughout what follows, t=0 corresponds to 10 (M) after the l=m=2 spherical multipole, and values of t<0 are to generally be considered outside of the fit's domain of applicability.

First, given m_1 and m_2 , one may calculate the symmetric mass-ratio via

$$\eta = \frac{m_1 m_2}{m_1 + m_2} \, .$$

With the symmetric mass-ratio, one may use a phenomenological fitting formula to quickly estimate the remnant BH's final mass, M, and dimensionless spin, $j = S/M^2$. While we present fitting formulas in Appendix C, an alternative formula may be found in [72].

Now with the final BH's parameters at hand, individual QNM frequencies,

$$\tilde{\omega}_{lmn} = \omega_{lmn} + i/\tau_{lmn} ,$$

may be most readily obtained by using the fitting formulas presented in [25]. Alternatively one may use the tabulated values for $M\omega_{lmn}$ available at [73].

We have that estimates for the complex QNM excitation factors, A_{lmn} , may be found by evaluating the following series of equations:

$$\delta_m(\mathbf{m}_1, \mathbf{m}_2) \equiv \frac{|\mathbf{m}_1 + (-1)^m \mathbf{m}_2|}{\mathbf{m}_1 + \mathbf{m}_2}$$
 (A1)

$$A_{lmn} = \tilde{\omega}_{nlm}^2 \, \delta_m(\mathbf{m}_1, \mathbf{m}_2) \, \eta^{1+n} \sum_{u=0} |a_u| e^{i\alpha_u} \, \eta^u$$
 (A2)

Values for $|a_u|$ and α_u are given in Equations (2-10).

For the second order QNMs discussed in Sec. IV B, we have that

 $A_{(l_1,m_1,n_1)(l_2,m_2,n_2)} = \mu_{(l_1,m_1,n_1)(l_2,m_2,n_2)} A_{l_1,m_1,n_1} A_{l_2,m_2,n_2} \,,$ where for the (2,2,0)(2,2,0) mode we find that

$$\mu_{(2,2,0)(2,2,0)} = 5.3956$$
,

and for the (2,2,0)(3,3,0) mode,

$$\mu_{(2,2,0)(3,3,0)} = 4.6354$$
.

Keeping in mind that all tabulated coefficients correspond to $T_0 = 10$ (M), the full time domain ringdown waveform may be calculated by first evaluating the spheroidal harmonics, $_{-2}S_{lm}(j\tilde{\omega}_{lmn}, \theta, \phi)$ (via [8]), then evaluating

$$\psi_4(t,\theta,\phi) = \frac{1}{r} \sum_{l,m,n} \psi_{lmn}^{PT}(t) \left[{}_{-2}S_{lm}(j\tilde{\omega}_{lmn},\theta,\phi) \right]$$

where

$$\psi_{lmn}^{\rm PT}(t) = A_{lmn} e^{i\tilde{\omega}_{lmn}t}$$

Alternatively, one may calculate the spherical multipole moments by evaluating

$$\psi_{l'm}^{NR}(t) = \sum_{n,l} A_{lmn} \, \sigma_{l'lmn} \, e^{i\tilde{\omega}_{lmn}t}$$

where

$$\sigma_{l'lmn} \equiv \int_{\Omega} {}_{-2}S_{lm}(j\tilde{\omega}_{lmn},\theta,\phi) {}_{-2}\bar{Y}_{l'm}(\theta,\phi) d\Omega.$$

While we have suppressed the second order notation for simplicity, one may again impose the notion that each full second order QNM corresponds to products of two first order modes. With the two expressions for $\psi_{l'm}^{\rm NR}(t)$ and $\psi_{lmn}^{\rm PT}(t)$ above, we have completed our algorithmic description for calculating ringdown waveforms using the initial binary's component masses.

While our discussion thus far has been limited to first and fundamental overtones, n=0 and n=1, it should also be noted that consistent evidence for the n=2, l=m=2, overtone may be readily observed by considering fitting regions closer to the $\psi_{lm}^{\rm NR}$ luminosity. Figure 14 displays this overtone scaled relative to $T_0=10~(M)$. Though the general trend is reminiscent of the n=0 and n=1 overtones, the n=2 mode's faster decay rate corresponds to larger variation with fitting region (e.g. larger error bars).

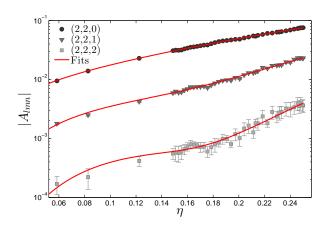


FIG. 14. The n=0,1 and 2 overtones of the l=m=2 QNM excitation recovered from NR ringdown for initially nonspinning unequal mass-ratio BH binaries. The error bars were calculated as described in Sec. III A- f.

Appendix B: The Start of Ringdown

While it is not possible to define an absolute start of ringdown, we may make a practical definition by asking which potential ringdown region is best modeled by QNMs only. This question may be addressed by finding

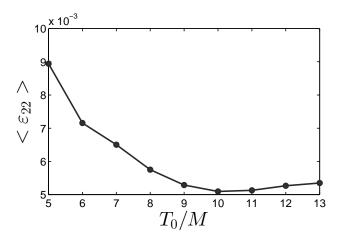


FIG. 15. Mean fractional root-mean-square error (Eq.(21)) for the l=m=2 multipole with respect to the fitting region start time, T_0 . Here the *greedy-OLS* (Sec. III A) algorithm was used to used to perform a multimode fit for each fitting region.

a local minimum in residual error with respect to fitting region start time. To this end let us consider the multipole which is least effected by numerical errors: $\psi_{22}^{\rm NR}.$ Figure 15 shows its residual error [Eq.(21)] on symmetric mass-ratio. The trend observed here is inherently systematic as, when moving towards the peak in radiation, the data are no longer dominated by QNMs, while, when moving away from the peak, numerical noise eventually dominates.

Consequently, although there is a visible minimum at $T_0 = 10$ (M), it is not the global minimum, as ε_{22} fluc-

tuates in the numerical noise following $T_0=13~(M)$. However, 10~(M) nevertheless gives us a practical starting point within which the majority of $\psi_{lm}^{\rm NR}$ is above the numerical noise floor.

TABLE IV. Fitting coefficients for $M_f(\eta)$ (Eq.(C2)) and $j_f(\eta)$ (Eq.(C1)).

	t_0	t_1	t_2	t_3	t_4	t_5
M	1	-0.046297	-0.71006	1.5028	-4.0124	-0.28448
j	0	3.4339	-3.7988	5.7733	-6.378	0

Appendix C: Final Mass and Spin

As noted in [72], the final mass and spin dependence on initial binary symmetric mass-ratio may be well fit by a polynomial in η . Alternatively, the more recent study, Ref. [24], shows that the final BH parameters may also be well modeled as a power series in $m_1 - m_2$. Here, we present a methodologically different fit than that presented in [72] and [24], while maintaining the η parametrization of [72]. Specifically, when fitting final dimensionless spin, j_f , we choose to directly impose the boundary condition that as $\eta \to 0$, $j_f \to 0$. In particular, we fit

$$j_f(\eta) = \eta \sum_{k=1} t_k \, \eta^{k-1} \tag{C1}$$

Similarly, when fitting final mass, M_f , we choose to directly impose the boundary condition that as $\eta \to 0$, $M_f \to 1$. In particular, we fit

$$M_f(\eta) = 1 - \eta \sum_{k=1} t'_k \eta^{k-1}.$$
 (C2)

The fitting result for $j_f(\eta)$ is shown in Fig. 2. Fitting coefficients are tabulated in Table IV. While the fitting results here are consistent with [72] and [24] within their fit's domain of applicability (deviations are within 1% of the values reported), we expect that the forms given in C1 and C2 bias the fit towards the physically correct solution outside of the fitting domain.

Consistency with multimode Fit.— The numerical values used to make the above fits (Table IV) were calculated using the isolated horizon formalism [49]. However, final BH mass and spin may also be estimated using ringdown fitting (e.g. [31, 52]). For the numerical runs considered here, we find that single mode fitting recovers the horizon estimate to within $\sim 5\%$, while multimode fitting recovers the horizon estimate to within $\sim 0.5\%$. This level of agreement is within the numerical error of the isolated horizon estimate.

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