First survey of spinning eccentric black hole mergers: Numerical relativity simulations, hybrid waveforms, and parameter estimation

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We analyze a new numerical relativity dataset of spinning but nonprecessing binary black holes on eccentric orbits, with eccentricities from approximately 0.1 to 0.5, with dimensionless spins up to 0.75 included at mass ratios $q = m_1/m_2 = (1, 2)$, and further nonspinning binaries at mass ratios q = (1.5, 3, 4). A comparison of the final mass and spin of these simulations with noneccentric data extends previous results in the literature on circularization of eccentric binaries to the spinning case. For the (l, m) = (2, 2) spin-weighted spherical harmonic mode, we construct eccentric hybrid waveforms that connect the numerical relativity data to a post-Newtonian description for the inspiral, and we discuss the limitations in the current knowledge about post-Newtonian theory which complicate the generation of eccentric hybrid waveforms. We also perform a Bayesian parameter estimation study, quantifying the parameter biases introduced when using three different quasicircular waveform models to estimate the parameters of highly eccentric binary systems. We find that the used aligned-spin quasicircular model including higher order modes produces lower bias in certain parameters than the nonprecessing quasicircular model without higher order modes and the quasicircular precessing model.

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I. INTRODUCTION

The detections of gravitational wave signals [1–8] have been found to be consistent with models of the waveform emitted from the merger of compact objects under the assumption of quasicircularity of the binary's orbit prior to the merger. The assumption of quasicircularity motivated by the efficient circularization of binaries as a consequence of the emission of gravitational waves [9,10] simplifies significantly the complexity of the signal and has accelerated the development of inpiral-merger-ringdown (IMR) waveform models: several mature IMR models for quasicircular coalescences, i.e., neglecting eccentricity, are now publicly available [11–24] and are being used to search and infer the parameters of observed binary black hole systems [7].

Recently, population synthesis studies [25–28] have shown that active galactic nuclei and globular clusters can host a population of moderate and highly eccentric binaries emitted in the frequency band of ground-based detectors. Therefore, the increase in sensitivity of the detectors will increase the likelihood of detecting binary systems with non-negligible eccentricities. The modeling of the gravitational waveforms from eccentric black hole binaries is complicated by the addition of a new timescale to the binary problem, the periastron precession [29]. This new timescale induces oscillations in the waveforms due to the asymmetric emission of gravitational radiation between the apastron and periastron passages.

The orbits of eccentric black hole binaries are typically described using the quasi-Keplerian (QK) parametrization [30], which is currently known up to 3 post-Newtonian (PN) order [31]. This parametrization has proved to be a key element in developing inspiral PN waveforms [32–36]. The generation of IMR eccentric models relies on the connection of an eccentric PN inspiral with a circular merger [37,38]. Alternatively, one can substitute the PN waveform with one produced within the effective one body (EOB) formalism describing an eccentric inspiral [39–41]. Some eccentric IMR waveform models show good agreement with numerical waveforms up to $e \sim 0.2$ for nonspinning configurations [37]. Recent work has shown possible extensions of the eccentric PN and EOB inspiral waveforms to include spin effects [41,42]. A key step in the generation of IMR waveform models is the production of hybrid waveforms [43-49] between PN/EOB inspiral and numerical relativity (NR) waveforms. The hybridization procedure consists of smoothly attaching a PN/EOB inspiral waveform to a NR one to get the full description of the gravitational radiation of the binary system. The generation of datasets of hybrid waveforms has been used in the quasicircular case to calibrate and validate the accuracy of IMR waveform models [16–18,22,23].

In this paper we present the input data and some key tools required for the development of an IMR eccentric waveform model calibrated to eccentric hybrid PN-NR waveforms. In Sec. II we first present our NR catalog of nonspinning and spinning eccentric binaries, computed with the private BAM code [50] and the open-source EINSTEIN TOOLKIT (ET) [51,52]. This includes a discussion of our procedure to specify the initial parameters of the eccentric simulations in Sec. II B, a study of the remnant quantities in Sec. II C, and a new method for measuring the eccentricity of NR waveforms with arbitrarily high eccentricity in Sec. II D. We find that the final spin and mass are consistent within the error estimates with the quasicircular case, which extends the study in [53] to the eccentric spinning case. We hybridize the dominant gravitational waveform (l = 2, m = 2) mode between numerical relativity and post-Newtonian waveforms in Sec. III. This will provide the input data for future work on constructing waveform models that contain the inspiral, merger, and ringdown, and it allows us to perform injections into detector noise which contain a long inspiral phase. In Sec. IV we use such injections of hybrid waveforms, as well as those of pure numerical relativity waveforms, to study the parameter biases introduced when using quasicircular waveform models to estimate the parameters of highly eccentric spinning systems. Unless explicitly noted, we are working in geometric units G = c = 1. To simplify expressions, we will also set the total mass of the system M = 1 in Secs. II and III. We define the mass ratio $q = m_1/m_2$ with the choice $m_1 > m_2$ so that q > 1. We also introduce the symmetric mass ratio $\eta = q/(1+q)^2$, and we shall denote the black hole's dimensionless spin vectors by $\vec{\chi}_i = \vec{S}_i / m_i^2$ for i = 1, 2.

II. NUMERICAL RELATIVITY DATASET

A. Overview

We present a catalog of 60 eccentric NR simulations performed with the nonpublic BAM code [50] and the opensource ET code [51,52] with the multipatch LLAMA infrastructure [54]. The numerical setup of both codes is the same as in [55]. Most of the simulations are run with the ET code using the LLAMA module due to its ability to extract the waves at larger extraction radii. The different simulations and their initial conditions are described in Table IV. In Fig. 1 we show our choices of mass ratio q, initial eccentricity e_0 , and effective spin parameter, $\chi_{eff} = (m_1\chi_{1,z} + m_2\chi_{2,z})/(m_1 + m_2)$. We have also added 20 public eccentric SXS simulations presented in [38].

B. Initial parameters of eccentric NR simulations

We use conformally flat Bowen-York initial data [57] in the center-of-mass frame, where the free parameters are the



FIG. 1. Initial eccentricity e_0 , mass ratio q, and effective spin parameter $\chi_{eff} = (m_1\chi_{1,z} + m_2\chi_{2,z})/(m_1 + m_2)$ for the numerical relativity simulations generated with the BAM, EINSTEIN TOOLKIT, and SpEC [56] codes. The thick black line represents the cases with $\chi_{eff} = 0$.

spins and masses of the two black holes, the separation, and the momentum of one of the two black holes (the momentum of the second black hole is then equal in magnitude but opposite in direction). We first choose the masses and spins as displayed in Fig. 1. To be able to construct hybrid waveforms, the minimal separation, i.e., the separation at periastron, has to be large enough that the PN approximation is still roughly valid. We then use a simple PN approximation as discussed below to compute the apastron separation required to achieve a chosen value of the eccentricity, and a further PN approximation to compute the appropriate value of the momentum corresponding to this value of the eccentricity. Owing to the simplicity, i.e., the low order, of the PN approximations used, neither the periastron separation nor the measured eccentricity will exactly coincide with the specified values. In this study we choose our initial choice for the approximate periastron separation to be $r_{\min} \sim 9M$, with slightly different values to account for mass ratio and spin effects which can significantly increase the computational cost of the simulations. We start our simulations at the apastron, where the PN approximation employed to specify the initial momentum and the agreement with the PN data that we use for hybridization will be more accurate than during other points of the orbit.

Larger choices of eccentricity for the same configuration of masses and spins thus lead to a larger merger time and number of orbits, as one can see in Table IV. For instance, focusing on simulations with identification numbers (IDs) 34, 35, and 36, one observes an increase in the merger time when increasing the initial eccentricity. This increase in merger time also implies an increase in the computational cost of the simulation.

Using the QK parametrization at Newtonian order, one can relate the initial minimum and maximum separations by

$$r_{\min} = r_{\max} \frac{1-e}{1+e}.$$
 (2.1)

As stated above, for our simulations we choose $r_{\min} \sim 9M$ such that the PN approximation is still roughly valid. Then for $e_0 = 0.1, 0.2, 0.5$ Eq. (2.1) implies that $r_{\max} = 11M$, 13.5*M*, 27*M*, respectively. These values of r_{\max} are rough estimates based on a Newtonian order calculation; in practice, we slightly modify those values of initial separations to account for the increase of computational cost depending on the mass ratio and the spins of the simulations as observed in Table IV. For instance, in the case of negative spin components the merger time is significantly reduced [58]; thus, we increase r_{\max} for e = 0.1, 0.2 cases to produce longer NR waveforms which are easier to hybridize afterward.

To produce initial data for a desired eccentricity, we then make use of Eq. (3.25) of [55] to perturb the initial tangential momentum of the black holes by a factor λ_t from its quasicircular value. The expression for λ_t in terms of the eccentricity at 1PN order is

$$\lambda_t(r, e_0, \eta, \operatorname{sign}) = 1 + \frac{e_0}{2} \times \operatorname{sign} \times \left[1 - \frac{1}{r}(\eta + 2)\right], \quad (2.2)$$

where η is the symmetric mass ratio, r is the orbital separation, and sign = ± 1 depends on the initial phase of the eccentricity estimator [55]. We refer the reader to Sec. III D of [55] for an explicit derivation of Eq. (2.2). Taking Eq. (2.2), we compute the correction factor applied to the momentum as the mean between the inverse of the expression with the plus sign plus the expression with the minus sign,

$$\bar{\lambda}_{t}^{0}(r, e_{0}, \eta) = \frac{1}{2} [\lambda_{t}(r, e_{0}, \eta, +1)^{-1} + \lambda_{t}(r, e_{0}, \eta, -1)]$$
$$= \frac{8r^{2} - e_{0}^{2}(\eta - r + 2)^{2}}{4r(e_{0}(-\eta + r - 2) + 2r)}.$$
(2.3)

We use the combination of factors in Eq. (2.3) because we have experimentally tested it to see that it works more accurately than just specifying a value of $\lambda_t(r, e, \text{sign})$ with a given sign. In Table IV one can compare the value of the desired initial eccentricity, e_0 , specified in Eq. (2.3), and the actually measured initial eccentricity, e_{ω} , from the orbital motion of the simulation. Both quantities are also displayed in Fig. 10, where we have differentiated among nonspinning and positive and negative spin simulations. The results point out that the use of Eq. (2.3) produces differences of less than 10% between e_{ω} and e_0 in nonspinning cases at low eccentricities of the order of 0.1. However, when spins are present or the eccentricities are higher, the inaccuracy of the formula becomes manifest, with differences of the order of 20%-30%, this is due to the fact that Eq. (2.2) was derived assuming a nonspinning binary in the low eccentric limit. Additionally, one can check in Table IV and Fig. 10 to see that the differences between e_{ω} and e_0 are smaller for the cases with positive spins than in cases with negative spins because in Eq. (2.2) the radiation reaction effects, which are more significant for negative spins, are also not taken into account.

C. Final state of spinning eccentric systems

We compare the final state of the eccentric NR simulations with the predicted final mass and final spin of the quasicircular (QC) NR fits [59] as an indicator of circularization of the coalescence process as the binary merges. This is basically an extension of [53] to the eccentric spinning case with more moderate values of the eccentricity but longer NR evolutions.

The final mass and final spin of the simulations are computed using the apparent horizon (AH) of the remnant black hole and are shown in Table IV. The magnitude S of the angular momentum of the final black hole can be computed from the integral

$$S = \frac{1}{8\pi} \oint_{AH} K_{ij} n^i \phi^j dA; \qquad (2.4)$$

see the discussion in [60,61]. Here for the BAM code [50] the vector ϕ^j is a coordinate-based approximation to the (approximate) axial Killing vector of the black hole horizon as in [60], and for the EINSTEIN TOOLKIT code the QuasiLocalMeasures module is used, which constructs an approximate Killing vector with rotational symmetry around the spin axis as in [62,63]. The vector n^i is a spacelike unit normal to the horizon surface and K_{ij} is the extrinsic curvature. The final mass can be computed from the Christodoulou formula in terms of the black hole (BH) angular momentum and AH area A as

$$M_f = \sqrt{M_{irr}^2 + \frac{S^2}{4M_{irr}^2}}, \qquad M_{irr} = \sqrt{\frac{A}{16\pi}}, \qquad (2.5)$$

where M_{irr} is the irreducible mass. The dimensionless final spin can then be computed as $\chi_f = S/M_f^2$.

In Fig. 2 we have computed the absolute and relative errors between the eccentric simulations and the quasicircular NR final mass and final spin fitting formulas [59],

$$\Delta X = \left| \frac{X^{\text{NR}}}{X^{\mathcal{QC}}} - 1 \right| \times 100, \qquad X = M_f \quad \text{or} \quad \chi_f. \tag{2.6}$$

The results in Fig. 2 show that the differences in the final spin are generally higher than in the final mass. However, the differences with respect to the quasicircular fitting values are as high as $\sim 1\%$, which is entirely consistent with numerical errors and gauge artifacts on the apparent horizon surfaces and inaccuracies in the fits. Hence, we can



FIG. 2. (Top panel) The absolute difference between the final mass and spin of the simulations and the QC NR fits as a function of the ID of the simulations in Table IV. (Bottom panel) The absolute relative error for the phase and amplitude, $\Delta X = |X^{\text{NR}}/X^{QC} - 1| \times 100$ for $X = M_f, \chi_f$, relative error of the final mass, and final spin of the simulations against the QC NR fits as a function of the ID of the simulations in Table IV.

conclude that within the current knowledge of systematic errors (compare with [59]), the final state of the eccentric simulations, up to the values of eccentricity studied here, is consistent with the quasicircular values. Identifying small physical deviations between the quasicircular and eccentric final states will require numerical simulations with improved error estimates.

D. Measuring the eccentricity of highly eccentric systems

This subsection aims to extend the discussion on the measurement of the eccentricity in NR presented in [55] to highly eccentric systems. An eccentricity parameter is chosen to describe the noncircularity of orbits, such that for bound orbits its value ranges between 0 and 1, corresponding to circular and extremely elliptical configurations, respectively. Such an eccentricity can be defined naturally only in Newtonian gravity, whereas in general relativity the eccentricity is a gauge dependent quantity. To measure the eccentricity in NR data, one defines quantities known as eccentricity estimators, which estimate the eccentricity from

the relative oscillations of a certain combination of dynamical quantities such as the orbital separation or orbital frequency, or wave quantities like the amplitude or frequency of the (l, m) = (2, 2) mode. All of these different estimators are usually defined such that they agree in the Newtonian limit and in the low eccentricity limit.

In [55], where we studied the reduction of residual eccentricity in initial datasets, we chose our eccentricity estimator based on the orbital frequency as

$$e_{\omega}(t) = \frac{\omega(t) - \omega(e=0)}{2\omega(e=0)} \equiv \frac{\omega(t) - \omega^{\text{fit}}(t)}{2\omega^{\text{fit}}(t)}, \quad (2.7)$$

where $\omega(t)$ is the orbital frequency of the simulation and $\omega(e=0)$ is the orbital frequency in the quasicircular limit. We note that when dealing with numerical simulations, the quasicircular frequency in Eq. (2.7) is typically replaced by a fit, $\omega^{\text{fit}}(t)$, of the nonoscillatory part of the frequency [55]. This eccentricity estimator is used largely to measure the residual eccentricity of NR simulations of quasicircular black hole binaries. We remark that while in Eq. (2.7) we decide to use the orbital frequency calculated from the BH motion, one can also use the gravitational wave frequency extracted from the waves as discussed below. Furthermore, gauge effects can impact the eccentricity measurement from the orbital frequency of NR codes as extensively discussed in the small eccentricity limit in [64,65]. Here we follow the practice used in the literature [55,64–66] to avoid contamination of the eccentricity measurement through the gauge quantities, like the choice of the value of the η -parameter in the gamma driver condition [67], which can lead to residual oscillations in the orbital frequency complicating the determination of the eccentricity.

In [55] we argued that the procedure shown there, based on Eq. (2.7), to measure the eccentricity is limited to values as high as $e \sim 0.1$ due to the lack of an accurate ansatz to fit the higher order contributions beyond the sinusoidal contribution. While the lack of an ansatz for high eccentricities is a clear limitation, the use of Eq. (2.7) biases the eccentricity measurement due to its reliance on a noneccentric fit of the orbital frequency and due to the fact that Eq. (2.7) for high eccentricities does not reduce to the common definition of eccentricity in the Newtonian limit.

Therefore, we decide to change to another estimator [68], constructed also from the orbital frequency,

$$e_{\omega}(t) = \frac{\omega_p^{1/2} - \omega_a^{1/2}}{\omega_p^{1/2} + \omega_a^{1/2}},$$
(2.8)

where ω_a , ω_p are the orbital frequencies at apastron and periastron, respectively. The eccentricity estimator in Eq. (2.8) does not depend on any noneccentric fit of the orbital frequency. Furthermore, as shown in Appendix B, the eccentricity estimator from Eq. (2.7) in the Newtonian limit at high eccentricities does not reduce to the



FIG. 3. Time evolution of the orbital frequency $M\omega_{\rm orb}$, the orbital frequency at apastron $M\omega_a$, the orbital frequency at periastron $M\omega_p$, and the eccentricity estimator e_{ω} defined in Eq. (2.8).

eccentricity parameter and it is not normalized, while the eccentricity estimator from Eq. (2.8) fulfills all these conditions.

We measure the eccentricity from the maxima and minima of the orbital frequency corresponding to the periastron and apastron passages, respectively. Additionally, we produce an interpolated function from the maxima ω_p and the minima ω_a and substitute them into Eq. (2.8) so that one can estimate the evolution of the eccentricity from those points. The interpolation is calculated using the Hermite method implemented in the function Interpolation in Mathematica [69]. The new procedure to measure the eccentricity is shown in Fig. 3, where the time evolution of the orbital frequency, the interpolated functions of the maxima and minima of the orbital frequency, and the eccentricity are shown for the configuration with ID 60 from Table IV. As expected, the eccentricity is a monotonically decaying function whose value at t = 200M, after the burst of junk radiation, is $e_{\omega} = 0.415 \pm 0.005$. The error in the eccentricity, δe_{ω} , is computed using error propagation: from Eq. (2.8) we obtain

$$\delta e_{\omega} = \frac{\delta \omega}{(\omega_a^{1/2} + \omega_p^{1/2})^2} \left[\frac{\omega_a^{1/2}}{\omega_p^{1/2}} + \frac{\omega_p^{1/2}}{\omega_a^{1/2}} \right], \qquad (2.9)$$

where we have assumed $\delta \omega_a = \delta \omega_p = \delta \omega$. Motivated by the results of the error in the convergence analysis of the orbital frequency in [70], we have taken as a conservative estimate $\delta \omega = 0.0001$. The error estimate of Eq. (2.9) is the statistical error associated with the eccentricity measurement taking into account the error of the orbital frequency from different resolutions of the NR simulations. We remark that this error does not take into account systematics coming from the use of a different eccentricity estimator, nor contributions from the interpolation error when the number of minima and maxima is small due to the short length of the simulations.

Because of the difficulties in quantifying the systematics associated with the choice of eccentricity estimator and the fact that the interpolation error is a subdominant effect for most of the simulations here, we restrict for simplicity our eccentricity error calculation to Eq. (2.9).

The main drawback of this method is that when the simulations are so short that there is only one minimum and one maximum, it becomes inefficient and inaccurate. Furthermore, one could choose the frequency of the (l,m) = (2,2) mode and compute the orbital frequency as $\omega_{\rm orb} \approx \omega_{22}/2$, employing the same method discussed in this section. Nevertheless, as pointed out in [64], the usage of the orbital frequency from the (2,2) mode requires additional postprocessing of the data due to the presence of high frequency noise when taking a time derivative of the phase of the (2,2) mode. As a conclusion, if one has long enough highly eccentric simulations, the method introduced in this section allows one to measure the eccentricity as a monotonically decaying function for the whole inspiral, which is a key tool to be used to construct a time domain eccentric waveform model.

III. HYBRIDIZATION OF ECCENTRIC WAVEFORMS

In the eccentric case the hybrization of the PN-NR waveforms is a challenging problem. The higher the eccentricity the stronger the interaction between the binary components at each periastron passage, which can break the post-Newtonian, weak-field, and low velocity approximation and generate a secular dephasing between both waveforms. Moreover, the lack of a general description in PN theory of eccentric black hole binary systems poses the main difficulty. Therefore, we briefly review the status of the PN theory for eccentric systems in Sec. III A. In Sec. III B we show an example of our procedure to hybridize eccentric PN-NR waveforms.

A. Review of eccentric post-Newtonian theory

As far as the authors know, the orbital averaged gravitational wave energy flux for eccentric binaries is known up to 3PN order [71] using the 3PN QK parametrization [31]. Our strategy consists of evolving the 3.5PN Hamilton's equations of motion in Arnowitt, Deser, and Misner transverse-traceless (ADMTT) gauge [72–74] for a point particle binary,

$$\frac{d\mathbf{X}}{dt} = \frac{\partial \mathcal{H}}{\partial \mathbf{P}}, \qquad \frac{d\mathbf{P}}{dt} = -\frac{\partial \mathcal{H}}{\partial \mathbf{X}} + \mathbf{F},
\frac{d\mathbf{S}_i}{dt} = \frac{\partial \mathcal{H}}{\partial \mathbf{S}_i} \times \mathbf{S}_i, \quad i = 1, 2,$$
(3.1)

with X, P, and S_i being the position, momentum, and spin vectors in the center-of-mass frame, \mathcal{H} the Hamiltonian described in Sec. II of [55], and F the radiation reaction

force described in [75] enhanced with the eccentric contribution to the energy flux from [71]. The eccentric term in the flux is expressed in the QK parametrization and depends only on the orbital frequency ω , which is computed while evolving the system, and the eccentricity e_t , for which we use its 3PN expression in terms of the orbital energy and the angular momentum of the system, which are variables computed at each time step.

The solution of the PN point particle equations, Eq. (3.1), can be used to compute the gravitational radiation emitted by the system. Here the lack of general PN expressions for the waveforms of point particles evolving on quasielliptical orbits sets a strong limitation. The instantaneous terms of the waveform multipoles are known up to 3PN order for general nonspinning systems with arbitrary eccentricity [76]. Recently, the complete description of the 3PN nonspinning multipoles was computed including tail, tail-of-tail, and memory terms within the QK parametrization for low eccentricities [77,78]. At this point using the 3PN instantaneous terms only [76] introduces more errors than the quadrupole order due to the missing tail and tail-of-tail terms that enter at 1.5PN, 2.5PN, and 3PN orders, respectively. Additionally, the translation of the generic solution we obtain from solving Eq. (3.1) to the QK form of the waveform modes in [77,78] is more involved due to the fact that they split the dynamical variables into adiabatic and postadiabatic contributions. Therefore, we will restrict here to the quadrupole formula to generate the (l, m) = (2, 2) mode and leave for future work the generation of full 3PN waveforms, which will additionally allow us to construct multimode eccentric hybrids.

B. Hybridization example

The hybridization of PN and NR waveforms consists of determining the time shift and phase offset, which minimizes the difference between both waveforms in a certain time window. This hybridization procedure is well established in the quasicircular case [43,48,49,79,80]. The time shift is usually computed by minimizing a suitable quantity that measures disagreement of the two waveforms, such as an overlap integral [48,80], or the deviation between phase or frequency of the (2,2) mode [49]. However, in the eccentric case the calculation of the time shift requires alignment of the peaks due to eccentricity of both waveforms in the hybridization window. This alignment is complicated to obtain with the phase because the peaks corresponding to each periastron passage are not very pronounced, and they are difficult to estimate. One could use the frequency of the (2,2) mode. However, it is a quantity obtained from a time derivative of the phase, which for NR waveforms tends to be noisy. As a consequence, for simplicity we use the amplitude of the (2,2)mode to determine the time shift of the waveform because it is a clean quantity with clearly defined peaks. We remark that aligning the oscillations of the amplitude of PN and NR waveforms in a certain hybridization window is equivalent to minimizing their difference, as the maximum agreement between both quantities is obtained when they are aligned at the eccentric peaks.

As an example, we take the NR simulation with ID 60 of Table IV, which is a mass ratio q = 4 nonspinning configuration with an initial eccentricity of $e_{\omega}^{0} = 0.415 \pm 0.005$ and initial orbital separation at apastron $D_{0} = 27.5M$. We take the initial conditions of the NR simulation defined by the initial position vector, momenta (velocities in the case of spEC waveforms), and dimensionless spin vectors: $\{X, P/V, S_{1}, S_{2}\}_{t=0}$. The fact that PN and NR coordinates for the initial data agree up to 1.5PN order [81–83] makes this identification a good approximation. However, we have checked to see that the differences between the PN and NR initial conditions can produce discrepancies between the NR and PN waveforms of the order of 10%.

To leverage these differences, we decide to modify the initial condition vector of the PN evolution by modifying the initial separation by a δr such that the difference in the amplitude of the Newman-Penrose scalar, ψ_4 , for the (2,2) mode between PN and NR is minimal. In our example we obtained $\delta r = 0.08$. The outcome of such a calculation can be observed in the top panel of Fig. 4, where the time domain amplitudes of the PN and NR waveforms are shown. We do not show the full time domain range of the hybrid waveform in the top panel of Fig. 4 to better display the matching PN/NR region. The procedure is also applied to eccentric aligned-spin configurations. We find that initial highly eccentric configurations require larger δr than low eccentric ones, and that the hybridization errors for high negative spins, where radiation reaction plays a dominant role, are 1 order of magnitude higher than for nonspinning or low spins due to the lack of expressions for PN spinning eccentric waveforms.

The procedure to construct the hybrid waveform is similar to the one presented in [49]. We first choose the matching region to be after the junk radiation burst; in our particular case we take $t/M \in (275, 375)$, which corresponds to less than one gravitational wave cycle, as shown in the top panel of Fig. 4. To understand the choice of this short hybridization window for eccentric waveforms, we first explain the criteria for hybridizing quasicircular ones, following [84]. Quasicircular waveforms are hybridized over several cycles, as the low frequency approximant, typically EOB, is very accurate and resembles faithfully the NR behavior during the late inspiral. Furthermore, hybridization over several cycles is required to accurately compute the time alignment between waveforms by averaging out residual oscillations due to eccentricity and high frequency numerical noise coming from NR. In the eccentric case, the time alignment is much easier to compute, as the peaks in the gravitational wave (GW) frequency ease such an alignment, so there is no need to use several cycles. Moreover, the inaccuracy of the current low frequency



FIG. 4. (Top panel) The time domain amplitude of the $|r\psi_4^{2,2}|$ mode. The blue thick and the red dashed curves represent the PN and NR waveforms, respectively, and the vertical black lines highlight the hybridization window. (Bottom panel) The absolute value of the relative error for the gravitational wave frequency and amplitude, $\Delta X = |X^{\text{hyb}}/X^{\text{NR}} - 1| \times 100$ for $X = \omega_{22}$, A_{22} , of the hybrid against the NR waveform in the matching region is displayed.

eccentric approximants also sets a clear limitation to faithfully reproduce the NR waveforms along several cycles. Hence, we have chosen a small hybridization window to ensure small errors in the GW amplitude and frequency between PN and NR. Choices of hybridization window including several cycles make that error increase to 10% or larger depending on the case, due to the inaccuracy of the PN approximant. We have also checked to see that the election of different peaks for hybridization in the GW amplitude (in the inspiral regime) does not significantly change the errors, maintaining them below 1% as quoted in the lower panel of Fig. 4.

After choosing the hybridization region, we have to compute the time shift τ and phase offset φ_0 , which reduce the difference between the PN and NR waveforms in the matching window,

$$h^{PN}(t) = e^{i\varphi_0} h^{\text{NR}}(t+\tau). \tag{3.2}$$

To align the waveforms in time, we choose τ such that it minimizes the amplitude difference along the matching

window. For the phase offset we decide to align the phases at the beginning of the window, $\varphi_0 = \phi^{\text{NR}}(t_0 - \tau) - \phi^{\text{PN}}(t_0)$, where t_0 is the initial time of the window. Once τ and φ_0 are calculated, the hybrid waveform is constructed as a piecewise function

$$h^{\text{hyb}}(t) = \begin{cases} e^{i\varphi_0} h^{\text{PN}}(t+\tau) & \text{if } t < t_1, \\ w^-(t) e^{i\varphi_0} h^{\text{PN}}(t+\tau) + w^+(t) h^{\text{NR}}(t) & \text{if } t_1 < t < t_2, \\ h^{\text{NR}}(t) & \text{if } t > t_2, \end{cases}$$
(3.3)

where $t_1 = 275M$ and $t_2 = 375M$. The functions $w^{\pm}(t)$ denote the blending functions defined in the interval $[t_1, t_2]$ that monotonically go from 0 to 1 and 1 to 0, respectively,

$$w^{+}(t)_{[t_1,t_2]} = \frac{t-t_1}{t_2-t_1}, \qquad w^{-}(t)_{[t_1,t_2]} = 1 - w^{+}(t).$$
 (3.4)

The result of the application of such a hybridization procedure can be observed in the bottom panel of Fig. 4, where the absolute value of the relative errors between the hybrid and NR amplitudes and frequencies are shown. The quantity ΔX is defined as $\Delta X = |X^{\text{hyb}}/X^{\text{NR}} - 1| \times 100$ for $X = A_{22}, \omega_{22}$. The errors in the gravitational wave frequency and amplitude are both below 1%, with those for the amplitude being slightly smaller due to the choice of the amplitude as the quantity with which to minimize the agreement between PN and NR waveforms.

Finally, note that the PN waveform used to produce the hybrid is evolved backward in time from $D_0/M = 27.5$ to $D_f/M = 60$. This makes the initial eccentricity increase with respect to the NR waveform. Next, we explicitly show the systematics affecting the measurement of the initial eccentricity of the hybrid. We display in Fig. 5 the time evolution of the orbital frequency for the same hybrid



FIG. 5. Time evolution of the orbital frequency $M\omega_{\rm orb}$ computed from the phase of $r\psi_4^{2,2}$, the orbital frequency computed from the dynamics, $\omega = |\frac{p \times r}{r^2}|$, and from the phase of the strain $h^{2,2}$.

waveform of Fig. 4, $\omega_{\text{orb}} \approx \dot{\phi}_{22}/2$, computed from the phase of the (2,2) mode of the Newman-Penrose scalar and the strain computed using the fixed-frequency integration algorithm [85]. We also compute the orbital frequency from the PN dynamics as

$$\omega = \left| \frac{\mathbf{v} \times \mathbf{r}}{\mathbf{r}^2} \right|,\tag{3.5}$$

where $r = |\mathbf{r}|$, and \mathbf{v} , \mathbf{r} are the velocity and the position vectors in the center-of-mass frame. The curves from Fig. 5 indicate that the orbital frequencies computed from ψ_4 and h overestimate and underestimate, respectively, the values of eccentricity with respect to the ones from the dynamics. This is confirmed from the values for the initial eccentricity one obtains from the orbital frequency of the strain ψ_4 and the dynamics $e_0^h = 0.55 \pm 0.01$, $e_0^{\psi_4} = 0.84 \pm 0.03$, and $e_0^{\rm dyn} = 0.65 \pm 0.01$, respectively. These three values of eccentricity are measured at the same initial time, t = 600M. These results lead to the conclusion that the eccentricity measured from the frequency of the (2,2) mode is higher for ψ_4 than for h. This can be understood using the fact that $h \approx \int \int \psi_4 dt' dt$; therefore, h is a smoother function than ψ_4 . As shown in Fig. 5, this is not a particular result of our procedure to measure the eccentricity but a general fact which can be reproduced by any method to measure the eccentricity based on the oscillations of the frequency of the (2,2) mode. We have decided to show the orbital frequency from the PN dynamics, as it contains more cycles and eases the visualization of the effect, but the same effect can be obtained with the orbital frequency from the BH motion of a NR simulation. Moreover, we remark that these differences were also noted in [64], where Puerrer et al. explicitly computed the factor between the eccentricity estimator calculated from the gravitational wave frequency of h and ψ_4 in the low eccentric limit. Thus, one expects to see these discrepancies even augmented as the eccentricity increases, as is the case for the waveforms studied in this article. We also note that we choose not to integrate backward too long in the past of the binary due to the inaccuracy of the eccentric PN fluxes, which makes the solutions inaccurate for extremely high eccentricities, and the inaccuracy of the PN expressions for the waveform, which also become more and more inaccurate for high eccentricities.

IV. PARAMETER ESTIMATION WITH ECCENTRIC SIGNALS

In this section we employ the waveforms introduced in Secs. II and III for data analysis studies. First, we analyze the impact of the eccentricity when computing overlaps against quasicircular models. Second, we perform parameter estimation studies injecting eccentric NR and hybrid waveforms into detector noise and compute parameter biases using three different IMR quasicircular models available in the LIGO libraries, LALSuite [86].

A. Match calculation

A generic black hole binary evolving in a quasielliptical orbit is described by 17 parameters. The intrinsic parameters are the individual masses of the binary m_1 , m_2 , the six components of the two spin vectors \vec{S}_1 and \vec{S}_2 , the orbital eccentricity e, and the argument of the periapsis Ω . The extrinsic parameters describing the sky position of the binary with respect to the detector are the distance from the detector to the source r, the coalescence time t_c , the inclination ι , the azimuthal angle φ , the right ascension (ϕ), the declination (θ), and the polarization angle (ψ). These parameters together describe the strain induced in a detector from a passing gravitational wave [87]:

$$h(t,\zeta,\Theta) = [F_+(\theta,\phi,\psi)h_+(t-t_c;\iota,\varphi,\zeta) + F_\times(\theta,\phi,\psi)h_\times(t-t_c;\iota,\varphi,\zeta)].$$
(4.1)

Where $\Theta = \{t_c, r, \theta, \phi, \iota, \varphi, \psi\}$ is the set of extrinsic parameters, $\zeta = \{m_1, m_2, \vec{S}_1, \vec{S}_2, e, \Omega\}$ are the intrinsic parameters, and F_+ , F_\times are the antenna patterns functions defined in [87]. The detector response is written in terms of the waveform polarizations (h_+, h_\times) , which combine to define the complex waveform strain

$$h(t) = h_{+} - ih_{\times} = \sum_{l=2}^{\infty} \sum_{m=-l}^{l} Y_{lm}^{-2}(\iota, \varphi) h_{lm}(t - t_{c}; \zeta), \quad (4.2)$$

where $Y_{lm}^{-2}(\iota, \varphi)$ are spin-weighted -2 spherical harmonics, and where h_{lm} refers to the (l, m) waveform mode. The comparison between two waveforms is usually quantified by an overlap integral, which is a noise-weighted inner product between signals [88], and which can be maximized over subsets or all of the parameters of the signal. Given a real-valued detector response, the inner product between the signal $h_{\text{resp}}^{S}(t)$ and the model $h_{\text{resp}}^{M}(t)$ is defined as

$$\langle h_{\rm resp}^{S} | h_{\rm resp}^{M} \rangle = 4 \operatorname{Re} \int_{0}^{+\infty} \frac{\tilde{h}_{\rm resp}^{S}(f) \tilde{h}_{\rm resp}^{M*}(f)}{S_{n}(|f|)} df, \qquad (4.3)$$

where h denotes the Fourier transform of h, h^* denotes the complex conjugate of h, and $S_n(|f|)$ is the one sided noise power spectral density (PSD) of the detector.

The normalized match optimized over a relative time shift and the initial orbital phase can be written as

$$\mathcal{M}(\iota_{S},\varphi_{0_{S}}) = \max_{\iota_{c},\varphi_{0_{S}}} \left[\frac{\langle h_{\text{resp}}^{S} | h_{\text{resp}}^{M} \rangle}{\sqrt{\langle h_{\text{resp}}^{S} | h_{\text{resp}}^{S} \rangle \langle h_{\text{resp}}^{M} | h_{\text{resp}}^{M} \rangle}} \right]. \quad (4.4)$$

The match is close to 1 when the model is able to faithfully reproduce the signal, while values of the match close to 0

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indicate large disagreement between the two waveforms. In Eq. (4.4) the match is computed for given values of the angles (t_S, φ_{0_S}) of the signal and maximizing over phase and time shifts. We will take only the h_{22} mode of the eccentric hybrids and a QC waveform model and compute single mode mismatches maximized over a time shift t_0 and a phase offset ϕ_0 as

$$\mathcal{MM} = \max_{t_0,\phi_0} \left[\frac{h_{22}^{\text{hyb}} | h_{22}^{\text{QC}}}{\sqrt{\langle h_{22}^{\text{hyb}} | h_{22}^{\text{hyb}} \rangle \langle h_{22}^{\text{QC}} | h_{22}^{\text{QC}} \rangle}} \right]. \quad (4.5)$$

To simplify the comparisons, we introduce the mismatch, $1 - \mathcal{M}\mathcal{M}$. Values of the mismatch close to zero indicate good agreement between the signal and the model, while the higher the mismatch the larger the difference between both waveforms, indicating that the model is not able to accurately represent the signal.

Having set the notation for the calculation of the mismatch, we compute the mismatch between the eccentric (2,2) mode hybrids computed in Sec. III and the quasicircular model PhenomX [22,23], which is an upgrade of the aligned-spin PhenomD model [11,12], with calibration to a larger NR dataset and also to extreme-mass ratio waveforms. We employ the Advanced LIGO "zero detuned high power" PSD [89] to compute the overlap in Eq. (4.3). The integral of Eq. (4.3) is evaluated within a frequency range of 20-2000 Hz. The nonmonotonic behavior of the GW frequency of eccentric systems complicates the determination of the frequency range of a signal in the detector band. The ideal case would be one in which the initial apastron and periastron frequencies are below 20 Hz. This would mean that the whole waveform starts before the cutoff frequencies of the detectors, and one observes the complete eccentric inspiral of the binary. Another possibility is that both frequencies are above 20 Hz; then the signal is very short and much of the inspiral waveform is lost. Finally, it is also possible that during some part of the waveform the periastron frequencies are above 20 Hz and apastron frequencies are below 20 Hz. The latter is typically the case for our hybrid waveforms.

In Fig. 6 we show the single mode mismatches between the eccentric hybrids and PhenomX for a range of total mass for a system where $M_T \in \{20, 200\}M_{\odot}$. As expected, for larger total masses of the system most of the waveform in the frequency band of the detector is in the merger and ringdown parts and the mismatches are even below the 3% threshold. This is consistent with the results obtained in Sec. II C, which show the agreement in the final state between the eccentric simulations and the quasicircular fits. However, the lower the total mass the higher the mismatch, this is due to the fact that at low frequencies there is a more inspiral part of the waveform in the frequency band, and therefore the inability of the quasicircular model to resemble the eccentric inspiral becomes notorious. One can also



FIG. 6. Mismatches for the (l, m) = (2, 2) mode between the eccentric hybrid waveforms corresponding to the cases presented in Table IV and the quasicircular PhenomX waveform model as a function of the total mass of the system. The green, blue, black, and red lines correspond to eccentric PN-NR hybrid waveforms with initial eccentricities $e \le 0.3$, $0.3 \le e \le 0.5$, and $0.5 \le e \le 0.84$, respectively.

appreciate in Fig. 6 that, generally, the higher the initial eccentricity the higher the mismatch for the whole mass range.

B. Eccentric injections into detector noise

In this section we show some applications of the eccentric waveform dataset to parameter estimation. We inject eccentric hybrids into Gaussian noise realization recolored to match the spectral density of the Advanced LIGO and Virgo detectors at design sensitivity. All simulations with the same injected signal are performed with the same noise realization. We do not address the challenge of detecting eccentric signals and instead assume that the signal has been detected by standard compact binary coalescence search pipelines [90]. We perform parameter estimation using the PYTHON-based BILBY code [91]. Of the numerous stochastic samplers implemented in BILBY, we employ the nested sampler CPNest [92] and use waveform approximants implemented in LALSuite [86] as the model templates. The eccentric hybrids make use of the numerical relativity injection infrastructure [93,94].

State-of-the-art nonspinning eccentric IMR models [37–40] have not yet been implemented in LALSuite. The only eccentric waveform models in LALSuite are inspiral nonspinning frequency domain approximants [32,95,96]. We have decided not to use such inspiral waveform models to avoid bias induced by the sharp cutoff at the end of the waveform [97]. For a study of the eccentricity measurement using such inspiral approximants, see [98,99]. We restrict to IMR quasicircular approximants and perform parameter estimation analysis on the injected eccentric signals by sampling in the 15 parameters of a quasicircular black hole binary.

TABLE I.	Summary of the injected NR simulations. The first column denotes the identifier of the simulation, and the second column
indicates the	e name of the simulation as presented in [38]. The next columns show the mass ratio, the z component of the dimensionless
spin vectors	, the initial orbital separation, and the initial orbital eccentricity measured using the procedure detailed in Sec. II D.

ID	Simulation	q	$\chi_{1,z}$	X2,z	D/M	$e_\omega\pm\delta e_\omega$
61	SXS:BBH:1355	1	0	0	12.97	0.090 ± 0.003
62	SXS:BBH:1359	1	0	0	15.73	0.146 ± 0.003
63	SXS:BBH:1361	1	0	0	16.69	0.209 ± 0.003

We inject three NR equal mass nonspinning simulations described in Table I into a network of gravitational wave detectors composed of the LIGO-Hanford, LIGO-Livingston [100], and Virgo interferometers [101], each operating at design sensitivity. We set a reference frequency of $f_{\rm ref} = 20$ Hz, where the waveforms start. Some injected parameters are displayed in Table II, while the declination is $\delta = -1.21$ rad, the right ascension $\alpha = 1.37$ rad, and the coalescence phase $\phi = 0$ rad. From these simulations, the $\{(l,m)\} = \{(2,\pm 2), (3,\pm 2), (4,\pm 4), (5,\pm 4), (6,\pm 6)\}$ modes are used. We do not inject odd m modes because they are zero by symmetry. For the injected signal we choose the luminosity distance $D_L = 430$ Mpc, which is similar to the first detection of a gravitational wave signal, GW150914 [7], which produces a high network signal-to-noise ratio (SNR), as shown in Tables II and III.

We employ a uniform-in-volume prior on the luminosity distance, $p(D_L|H) \propto D_L^2$, between 50 and 1500 Mpc. The inclination and polarization angles both have uniform priors between $(0, \pi)$. We use the standard priors for the extrinsic variables, as in Table I of [91]. Instead of sampling in the component masses, we sample in mass ratio q and chirp mass \mathcal{M}_c , with ranges $(0.05, 1)M_{\odot}$ and $(15, 60)M_{\odot}$, respectively. The spin priors are set differently according to

TABLE II. Black hole binary recovered parameters for the three NR simulations from Table I. The last row corresponds to the injected parameters. In the penultimate row we show the recovered parameters of the zero-eccentricity injection performed with the NRHybSur3dq8 model. The first column describes the initial eccentricity of the injected signal. Then we specify the approximant, the component masses, the chirp mass, the mass ratio, the luminosity distance, the effective spin parameter, the polarization angle, the inclination, the recovered matched-filter SNR for the detector network, and the log of the Bayes factor.

e_0	Model	m_1/M_{\odot}	m_2/M_{\odot}	\mathcal{M}_c/M_{\odot}	q	$D_L/{ m Mpc}$	$\chi_{ m eff}$	ψ (rad)	ı (rad)	$ ho_{\mathrm{Match}}$	$\log \mathcal{B}$
0.09	PhenomD	$35.06^{+2.55}_{-1.92}$	$31.29^{+1.10}_{-1.33}$	$28.40^{+0.17}_{-0.17}$	$0.87^{+0.10}_{-0.12}$	384_{-82}^{+49}	$0.00^{+0.02}_{-0.02}$	$1.60^{+1.28}_{-1.34}$	$0.54^{+0.32}_{-0.32}$	89.40	3463.79
	PhenomHM	$34.05^{+2.14}_{-1.16}$	$31.79^{+0.69}_{-1.17}$	$28.38^{+0.16}_{-0.16}$	$0.92^{+0.07}_{-0.11}$	429_{-33}^{+16}	$-0.01^{+0.02}_{-0.02}$	$2.01^{+0.97}_{-1.82}$	$0.28^{+0.21}_{-0.17}$	89.28	3463.78
	PhenomPv2	$35.26^{+2.97}_{-2.06}$	$31.28^{+1.18}_{-1.53}$	$28.44_{-0.18}^{+0.21}$	$0.86^{+0.11}_{-0.13}$	412_{-66}^{+24}	$0.00^{+0.02}_{-0.02}$	$1.65^{+1.22}_{-1.32}$	$0.39_{-0.22}^{+0.32}$	89.19	3459.54
0.14	PhenomD	$34.03^{+1.34}_{-0.72}$	$32.63^{+0.44}_{-0.73}$	$28.86^{+0.15}_{-0.15}$	$0.95^{+0.04}_{-0.07}$	407^{+53}_{-84}	$0.02^{+0.02}_{-0.02}$	$1.58^{+1.21}_{-1.23}$	$0.54^{+0.32}_{-0.32}$	84.87	3288.25
	PhenomHM	$33.76^{+0.96}_{-0.54}$	$32.73_{-0.56}^{+0.35}$	$28.82^{+0.16}_{-0.14}$	$0.96^{+0.03}_{-0.05}$	408_{-52}^{+46}	$0.02^{+0.02}_{-0.02}$	$1.91^{+0.46}_{-0.58}$	$0.54^{+0.19}_{-0.25}$	84.74	3283.61
	PhenomPv2	$34.22^{+1.48}_{-0.89}$	$32.54_{-0.82}^{+0.54}$	$28.87^{+0.19}_{-0.21}$	$0.94_{-0.08}^{+0.05}$	389_{-60}^{+33}	$0.01\substack{+0.02\\-0.03}$	$1.70^{+1.09}_{-1.07}$	$0.64_{-0.18}^{+0.25}$	85.08	3302.37
0.2	PhenomD	$35.65^{+1.52}_{-0.85}$	$34.01^{+0.51}_{-0.82}$	$30.13_{-0.16}^{+0.16}$	$0.94^{+0.05}_{-0.07}$	420^{+72}_{-109}	$0.07^{+0.02}_{-0.02}$	$1.57^{+1.36}_{-1.18}$	$0.61^{+0.41}_{-0.37}$	81.88	3102.70
	PhenomHM	$35.47^{+1.36}_{-0.78}$	$33.97^{+0.46}_{-0.72}$	$30.06^{+0.16}_{-0.15}$	$0.95^{+0.04}_{-0.07}$	438_{-47}^{+43}	$0.06^{+0.02}_{-0.02}$	$0.42^{+0.90}_{-0.29}$	$0.54^{+0.16}_{-0.20}$	81.97	3101.79
	PhenomPv2	$37.13^{+2.11}_{-1.76}$	$33.20^{+1.00}_{-1.12}$	$30.12_{-0.22}^{+0.21}$	$0.87_{-0.09}^{0.09}$	414_{-69}^{+41}	$0.06^{+0.02}_{-0.02}$	$1.62^{+0.98}_{-1.29}$	$0.66^{+0.25}_{-0.18}$	82.05	3112.97
0	PhenomD	$34.07_{-1.29}^{+2.05}$	$30.91^{+1.24}_{-1.77}$	$28.24\substack{+0.16 \\ -0.16}$	$0.91\substack{+0.07 \\ -0.10}$	375^{+48}_{-75}	$0.0\substack{+0.02 \\ -0.02}$	$1.58\substack{+1.28 \\ -1.24}$	$0.53\substack{+0.33 \\ -0.32}$	173.16	3632.19
	Injected	32.5	32.5	28.29	1	430	0	0.33	0.3		

TABLE III. Black hole binary recovered parameters for the spinning hybrid waveform from Fig. 9. The last row corresponds to the injected parameters. The first column describes the initial eccentricity of the injected signal. Then we specify the approximant, the component masses, the chirp mass, the mass ratio, the luminosity distance, the effective spin parameter, the polarization angle, the inclination, the recovered matched-filter SNR for the detector network, and the log of the Bayes factor.

e_0	Model	m_1/M_{\odot}	m_2/M_{\odot}	\mathcal{M}_c/M_{\odot}	q	$D_L/{ m Mpc}$	$\chi_{ m eff}$	ψ (rad)	ι (rad)	ρ_{Match}	$\log \mathcal{B}$
0.42	PhenomD	$37.52^{+1.30}_{-0.76}$	$36.04^{+0.49}_{-0.73}$	$31.86^{+0.19}_{-0.2}$	$0.95^{+0.04}_{-0.06}$	474_{-101}^{+62}	$0.06^{+0.02}_{-0.02}$	$2.60^{+0.31}_{-0.33}$	$1.54^{+1.22}_{-1.19}$	82.68	2895.91
	PhenomHM	$37.23^{+0.95}_{-0.37}$	$36.62^{+0.30}_{-0.81}$	$32.07_{-0.23}^{+0.18}$	$0.98^{+0.02}_{-0.06}$	384^{+54}_{-45}	$0.08^{+0.02}_{-0.02}$	$2.28^{+0.18}_{-0.16}$	$1.04^{+1.12}_{-0.26}$	82.54	2894.17
	PhenomPv2	$39.15^{+2.08}_{-1.62}$	$35.20_{-1.06}^{+0.84}$	$31.87_{-0.26}^{+0.23}$	$0.88\substack{+0.07\\-0.08}$	413_{-110}^{+77}	$0.05\substack{+0.03\\-0.03}$	$2.33_{-0.44}^{+0.33}$	$1.46^{+1.36}_{-0.45}$	82.62	2910.28
	Injected	32.5	32.5	28.29	1	430	-0.25	0.33	0.3		



FIG. 7. Posterior probability distributions for the injected NR simulations of Table I and a zero-eccentricity injection using the NRHybSur3dq8 model. The vertical dashed lines correspond to 90% credible regions. The magenta thick vertical line represents the injected value. The green, black, blue, and red curves represent distributions sampled using the IMRPhenomD approximant with injected initial eccentricities $e_0 = 0.0, 0.09, 0.14, 0.2$, respectively.

the approximant. If the approximant is nonprecessing, we set the option of aligned_spin=True in the BBHPriorDict function of BILBY, which samples in the dimensionless spin z components between -0.8 and +0.8. For precessing approximants we sample in the tilt angles (θ_1, θ_2) , the angle between the spin vectors ϕ_{12} , the angle between J and L ϕ_{JL} , and the dimensionless spin magnitudes (a_1, a_2) . The priors for $a_1, a_2, \theta_1, \theta_2, \phi_{JL}$, and ϕ_{12} are the same as in Table I of [91]. We also define a uniform prior for the coalescence time of 2 s centered at the injection time.

We take three quasicircular models as approximants: (1) IMRPhenomD [11,12], a nonprecessing model with only the $(2, \pm 2)$ modes, (2) IMRPhenomHM [15], a nonprecessing model including higher order modes, and (3) IMRPhenomPv2 [13], an effective precessing model.

We plot the posterior probability distribution for the chirp mass, mass ratio, effective spin parameter, and luminosity distance for the PhenomD approximant in Fig. 7 with 90% credible intervals specified by the dashed vertical lines and the injected values by the thick vertical magenta lines. As a control case, we also show in Fig. 7 the posterior distribution of an equal mass nonspinning zero-eccentricity injection performed using the hybridized surrogate model NRHybSur3dq8 [19] with the same injected

parameters as in Table II and recovered with the PhenomD model. The NRHybSur3dq8 injected waveform contains all higher order modes up to l = 4, which in this case seems to cause the small bias one observes in the luminosity distance when recovering with the PhenomD model, which contains only the (2, |2|) modes. For the rest of the parameters, like the mass ratio, the chirp mass, and the effective spin parameter, we obtain results consistent with the accuracy of the PhenomD model for parameter estimation of injected signals as shown in [22].

The posterior distributions for the rest of the approximants are shown in Fig. 13. The same information is summarized in Fig. 8, where the median and the error bars corresponding to the 90% credible intervals of the posterior distribution are shown as a function of the initial eccentricity. Note that the bars corresponding to the same initial eccentricity but different approximants have been separated by a small amount to ease the visualization of the results. For the lowest initial eccentricity, $e_0 = 0.09$, the results for the four quantities are pretty different. The chirp mass and the effective spin parameter produce similar distributions for the three approximants, while for the mass ratio and the luminosity distance, PhenomHM distributions are closer to the injected values than PhenomD and PhenomPv2.



FIG. 8. Median values and error bars corresponding to 90% credible regions of the posterior probability distributions for the injected NR simulations of Table I. The vertical magenta line represents the injected value. The black, blue, and red segments represent the median values and errors bars of the distributions sampled using the IMRPhenomD, IMRPhenomHM, and IMRPhenomPv2 approximants, respectively. The cases are represented for three initial eccentricities of the injected signal, $e_0 = 0.09$, 0.14, 0.2. To ease the visualization of the horizontal bars, cases with the same initial eccentricity and run with different approximants have been separated at $\Delta e = 0.003$.

Furthermore, for $e_0 = 0.14$ and $e_0 = 0.2$ we observe increasingly poor agreement with the injected values, except for the mass ratio, where the lowest initial eccentricity signal produces wider distributions than those with higher initial eccentricities. This can also be checked in Table II, where the recovered parameters, median values, and 90% credible intervals are compared with the injected values. Regarding the effective spin parameter and the chirp mass, the increase of initial eccentricity in the injected signal shifts the posteriors for the three quasicircular models, while for the mass ratio the increase of initial eccentricity reduces the bias on the measurement of the mass ratio, probably as a consequence of the shift in the chirp mass distribution, as displayed in Fig. 11 for all injections recovered with the PhenomD model.

One observes also that PhenomHM recovers the injected parameters more effectively than PhenomD and PhenomPv2. For the luminosity distance the probability densities tend to flatten and be closer to the prior distributions for high initial eccentricities. One notes again that PhenomHM has less parameter bias than PhenomD and PhenomPv2. Injected values of the sky position like the right ascension $\alpha = 1.375$ rad and $\delta = -1.21$ rad are well recovered for all nine runs, probably due to the

expensive parameter estimation (PE) settings described in Appendix C: $\alpha = 1.37^{+0.01}_{-0.01}$ rad and $\delta = -1.21^{+0.01}_{-0.01}$ rad.

Furthermore, we have computed the recovered matchedfilter SNR for the detector network, ρ_{Match} , for each simulation. This quantity, ρ_{Match} , is computed calculating the matched filter between the detector data with the eccentric signal injected and the waveform of the approximant waveform model with the parameters corresponding to the highest log-likelihood value of the posterior distribution. The results of such a calculation are shown in Table I. As expected, we observe that the zero-eccentricity injection recovers much more SNR than the eccentric injections, with decreasing values of the recovered SNR with increasing eccentricity.

Additionally, we display the values of the log Bayes factor for each simulation. The Bayes factor is computed here as the ratio between the signal and null evidence [see Eq. (13) of [102]]. One can observe that both the recovered matched-filter SNR and the log Bayes factor decrease more the higher the initial eccentricity of the injected signal is. The matched-filter SNR produces similar values between models for simulations with the same initial eccentricity. However, the log Bayes factor tends to be slightly higher for the aligned-spin waveform models, PhenomD and

PhenomHM, for the lowest initial eccentric injected signal, while for higher initial eccentricities the precessing model IMRPhenomPv2 shows slightly greater log Bayes factors than the aligned-spin ones. The highest log Bayes factor is obtained for the zero-eccentricity injection.

We repeat the same procedure while injecting a hybrid waveform, including only the $(l, m) = (2, \pm 2)$ modes, of an eccentric spinning waveform with ID 8 of Table IV. This is an equal mass with the z component of the dimensionless spin vectors $\chi_{1z} = \chi_{2z} = -0.25$ and initial eccentricity $e_0 = 0.420 \pm 0.006$. The posterior distribution for the chirp

mass, mass ratio, luminosity distance, and χ_{eff} are shown in Fig. 9 for IMRPhenomD, IMRPhenomHM, and IMRPhenomPv2 as waveform models. In this case, the parameter biases are much higher than in the previous injection study mainly due to the fact that the injected signal has a much higher initial eccentricity.

The values of the recovered parameters as well as the injected values are shown in Table III. The injected values of the sky position like the right ascension $\alpha = 1.375$ rad and $\delta = -1.21$ rad are again well recovered parameters for the three runs $\alpha = 1.37^{+0.01}_{-0.01}$ rad and $\delta = -1.21^{+0.01}_{-0.01}$ rad.

TABLE IV. Summary of the eccentric NR simulations used in this work. In the first column we indicate the identifier of the simulation. Additionally, each simulation is specified by its mass ratio $q = m_1/m_2 \ge 1$, the code with it was produced, the z component of the dimensionless spin vectors $\chi_{1,z}, \chi_{2,z}$, the orbital separation D/M, the desired initial eccentricity e_0 used in Eq. (2.4) and the actual measured initial orbital eccentricity e_{ω} and its error δe_{ω} , the time to merger T_{merger}/M , the number of orbits N_{orbits} , the final mass M_f , and the magnitude of the dimensionless final spin χ_f .

ID	Simulation	Code	q	$\chi_{1,z}$	$\chi_{2,z}$	$\chi_{ m eff}$	D/M	e_0	$e_\omega \pm \delta e_\omega$	$T_{\rm merger}/M$	Norbits	M_{f}	χ_f
1	q1. 0. 0. et0.1 D12.23	BAM	1	0	0	0	12.23	0.1	0.114 ± 0.002	1256.42	4.5	0.9527	0.6871
2	q100et0.2_D15	BAM	1	0	0	0	15.0	0.2	0.210 ± 0.002	1682.01	5.2	0.9533	0.6895
3	q100et0.1_D15	BAM	1	0	0	0	15.0	0.1	0.095 ± 0.002	2961.01	8.3	0.9525	0.6869
4	q100et0.2_D17	BAM	1	0	0	0	17.0	0.2	0.195 ± 0.003	2917.42	8.2	0.9535	0.6889
5	q100et0.3_D20	BAM	1	0	0	0	20.0	0.3	0.301 ± 0.001	497.48	1.5	0.9548	0.6950
6	Eccq100.25_et0.1_D14	ET	1	0	0.25	0.125	14.0	0.1	0.100 ± 0.002	2319.85	6.4	0.9480	0.7249
7	Eccq100.25_et0.2_D16	ET	1	0	0.25	0.125	16.0	0.2	0.217 ± 0.003	2449.84	5.8	0.9474	0.7243
8	Eccq10.250.25_et0.1_D12	ET	1	-0.25	-0.25	-0.25	12.0	0.1	0.148 ± 0.002	939.87	2.8	0.9579	0.6080
9	Eccq10.25_0.25_et0.1_D12	ET	1	0.25	0.25	0.25	12.0	0.1	0.131 ± 0.002	1347.59	4.8	0.9440	0.7605
10	Eccq10.250.25_et0.1_D14	ET	1	-0.25	-0.25	-0.25	14.0	0.1	0.134 ± 0.002	1897.26	5.3	0.9573	0.6091
11	Eccq10.25_0.25_et0.1_D14	ET	1	0.25	0.25	0.25	14.0	0.1	0.112 ± 0.003	2464.75	7.6	0.9440	0.7607
12	Eccq10.250.25_et0.2_D14	ET	1	-0.25	-0.25	-0.25	14.0	0.2	0.249 ± 0.002	1067.25	3.8	0.9578	0.6109
13	Eccq10.25_0.25_et0.2_D14	ET	1	0.25	0.25	0.25	14.0	0.2	0.194 ± 0.002	1499.92	5.0	0.9432	0.7620
14	Eccq10.25_0.25_et0.2_D16	ET	1	0.25	0.25	0.25	16.0	0.2	0.199 ± 0.003	2599.90	8.9	0.9437	0.7624
15	Eccq10.250.25_et0.5_D26	ET	1	-0.25	-0.25	-0.25	26.0	0.5	0.38 ± 0.004	3287.31	7.7	0.9566	0.6080
16	Eccq10.25_0.25_et0.5_D26	ET	1	0.25	0.25	0.25	26.0	0.5	0.418 ± 0.004	4613.02	11.3	0.9428	0.7604
17	Eccq10.25_0et0.1_D14	ET	1	0.25	0.	0.125	14.0	0.1	0.128 ± 0.003	2302.69	7.2	0.9480	0.7249
18	Eccq10.25_0et0.2_D16	ET	1	0.25	0.	0.125	16.0	0.2	0.161 ± 0.002	2411.27	7.4	0.9474	0.7242
19	Eccq10.50.5_et0.1_D13	ET	1	-0.5	-0.5	-0.5	13.0	0.1	0.143 ± 0.002	1131.58	3.2	0.9623	0.5286
20	Eccq10.5_0.5_et0.1_D13	ET	1	0.5	0.5	0.5	13.0	0.1	0.116 ± 0.002	2071.02	7.3	0.9323	0.8309
21	Eccq10.50.5_et0.2_D15	ET	1	-0.5	-0.5	-0.5	15.0	0.2	0.104 ± 0.001	1170.51	3.3	0.9624	0.5298
22	Eccq10.5_0.5_et0.2_D15	ET	1	0.5	0.5	0.5	15.0	0.2	0.194 ± 0.002	2290.43	7.7	0.9329	0.8323
23	Eccq10.50.5_et0.5_D26	ET	1	0.5	0.5	0.5	26.0	0.5	0.505 ± 0.005	2675.44	6.1	0.9622	0.5230
24	Eccq10.5_0.5_et0.5_D26	ET	1	0.5	0.5	0.5	26.0	0.5	0.400 ± 0.004	5307.53	13.4	0.9322	0.8294
25	Eccq10.750.75_et0.1_D13	ET	1	-0.75	-0.75	-0.75	13.0	0.1	0.144 ± 0.002	907.44	2.5	0.9654	0.4458
26	Eccq10.75_0.75_et0.1_D13	ET	1	0.75	0.75	0.75	13.0	0.1	0.089 ± 0.002	2307.95	8.3	0.9156	0.8934
27	Eccq10.750.75_et0.2_D15	ET	1	-0.75	-0.75	-0.75	15.0	0.2	0.249 ± 0.002	902.561	2.6	0.9657	0.4475
28	Eccq10.75_0.75_et0.2_D15	ET	1	0.75	0.75	0.75	15.0	0.2	0.181 ± 0.002	2629.47	9.5	0.9149	0.8904
29	Eccq10.750.75_et0.5_D26	ET	1	-0.75	-0.75	-0.75	26.0	0.5	0.339 ± 0.003	2079.87	4.1	0.9655	0.4506
30	Eccq10.75_0.75_et0.5_D26	ET	1	0.75	0.75	0.75	26.0	0.5	0.373 ± 0.004	5907.6	15.1	0.9158	0.8843
31	Eccq1.5_00et0.1_D13	ET	1.5	0	0	0	13.0	0.1	0.108 ± 0.002	1606.33	5.2	0.9552	0.6651
32	Eccq1.5_00et0.2_D13.5	ET	1.5	0	0	0	13.5	0.2	0.126 ± 0.001	1142.56	3.8	0.9553	0.6619
33	Eccq1.5_00et0.2_D15	ET	1.5	0	0	0	15.0	0.2	0.245 ± 0.002	1809.34	5.4	0.9548	0.6636
34	Eccq200et0.1_D13	ET	2	0	0	0	13.0	0.1	0.106 ± 0.002	1738.71	5.3	0.9610	0.6232
35	Eccq200et0.2_D16	ET	2	0	0	0	16.0	0.2	0.167 ± 0.002	2499.02	7.5	0.9610	0.6249
36	Eccq200et0.5_D26	ET	2	0	0	0	26.0	0.5	0.422 ± 0.004	4380.33	10.4	0.9609	0.6262
37	Eccq20.250.25_et0.1_D12	ET	2	-0.25	-0.25	-0.25	12.0	0.1	0.138 ± 0.002	1026.39	3.2	0.9664	0.5283

(Table continued)

TABLE IV. (Continued)

ID	Simulation	Code	q	X1,z	X2,z	$\chi_{ m eff}$	D/M	e_0	$e_{\omega} \pm \delta e_{\omega}$	$T_{\rm merger}/M$	Norbits	M_{f}	χ_f
38	Eccq20.25_0.25_et0.1_D12	ET	2	0.25	0.25	0.25	12.0	0.1	0.103 ± 0.002	1435.07	5.1	0.9544	0.7170
39	Eccq20.250.25_et0.1_D14	ET	2	-0.25	-0.25	-0.25	14.0	0.1	0.130 ± 0.002	2001.7	5.6	0.9663	0.5261
40	Eccq20.25_0.25_et0.1_D14	ET	2	0.25	0.25	0.25	14.0	0.1	0.103 ± 0.002	2707.25	8.3	0.9544	0.7155
41	Eccq20.250.25_et0.2_D14	ET	2	-0.25	-0.25	-0.25	14.0	0.2	0.072 ± 0.001	1123.58	3.5	0.9660	0.5300
42	Eccq20.25_0.25_et0.2_D14	ET	2	0.25	0.25	0.25	14.0	0.2	0.219 ± 0.002	1708.92	5.6	0.9548	0.7151
43	Eccq20.250.25_et0.2_D16	ET	2	-0.25	-0.25	-0.25	16.0	0.2	0.225 ± 0.003	2085.67	5.8	0.9663	0.5253
44	Eccq20.25_0.25_et0.2_D16	ET	2	0.25	0.25	0.25	16.0	0.2	0.188 ± 0.003	2847.34	8.3	0.9549	0.7165
45	Eccq20.250.25_et0.5_D26	ET	2	-0.25	-0.25	-0.25	26.0	0.5	0.392 ± 0.003	3628.05	8.4	0.9665	0.5308
46	Eccq20.25_0.25_et0.5_D26	ET	2	0.25	0.25	0.25	26.0	0.5	0.411 ± 0.004	5203.86	12.5	0.9542	0.7140
47	Eccq20.5_0.5_et0.1_D14	ET	2	0.5	0.5	0.5	14.0	0.1	0.095 ± 0.002	2985.28	9.1	0.9448	0.8052
48	Eccq20.50.5_et0.1_D14	ET	2	-0.5	-0.5	-0.5	14.0	0.1	0.158 ± 0.003	1714.88	4.2	0.9698	0.4279
49	Eccq20.50.5_et0.2_D16	ET	2	-0.5	-0.5	-0.5	16.0	0.2	0.277 ± 0.003	1712.98	4.2	0.9696	0.4300
50	Eccq20.5_0.5_et0.2_D16	ET	2	0.5	0.5	0.5	16.0	0.2	0.180 ± 0.003	3294.21	10.5	0.9451	0.8035
51	Eccq20.50.5_et0.5_D27	ET	2	-0.5	-0.5	-0.5	27.0	0.5	0.393 ± 0.004	3522.66	7.2	0.9696	0.4328
52	Eccq20.750.75_et0.1_D14	ET	2	-0.75	-0.75	-0.75	14.0	0.1	0.137 ± 0.002	1386.95	3.2	0.9725	0.3273
53	Eccq20.750.75_et0.2_D16	ET	2	-0.75	-0.75	-0.75	16.0	0.2	0.125 ± 0.002	1353.72	3.4	0.9728	0.3297
54	Eccq300et0.1_D13	ET	3	0	0	0	13.0	0.1	0.104 ± 0.002	1978.55	6.1	0.9713	0.5414
55	Eccq300et0.2_D15	ET	3	0	0	0	15.0	0.2	0.166 ± 0.002	2156.21	6.2	0.9710	0.5401
56	Eccq300et0.5_D26	ET	3	0	0	0	26.0	0.5	0.416 ± 0.004	5029.06	11.5	0.9710	0.5385
57	Eccq400et0.1_D12	ET	4	0	0	0	12.0	0.1	0.134 ± 0.002	1609.06	5.3	0.9780	0.4725
58	Eccq400et0.2_D15	ET	4	0	0	0	15.0	0.2	0.176 ± 0.002	2412.73	7.4	0.9779	0.4731
59	Eccq400et0.5_D27	ET	4	0	0	0	27.0	0.5	0.412 ± 0.004	6698.64	15.2	0.9779	0.4739
60	Eccq400et0.5_D27.5	ET	4	0	0	0	27.5	0.5	0.415 ± 0.005	7422.59	16.4	0.9784	0.4717



FIG. 9. Posterior probability distributions for the injected spinning eccentric hybrid waveform with initial eccentricity $e_0 = 0.420 \pm 0.006$. The vertical dashed lines correspond to 90% credible regions. The thick vertical magenta line represents the injected value. The black, blue, and red curves represent distributions sampled using the IMRPhenomD, IMRPhenomHM, and IMRPhenomPv2 approximants, respectively.

The bias in the chirp mass is ~4 M_{\odot} for the three models. Here one again observes the correlation between chirp mass and mass ratio. The shift in chirp mass posteriors with respect to the injected value translates into a better determined mass ratio distribution, which is clearly the case for PhenomHM, which performs unexpectedly well in recovering the mass ratio parameter, while PhenomD and PhenomPv2 show much wider distributions and much larger credible intervals.

The posteriors of the luminosity distance show also large error bars for the three models, where PhenomHM again reduces the bias with respect to PhenomD and PhenomPv2. The recovered effective spin parameter is completely off with respect to the injected value for the three approximants. The recovered χ_{eff} is positive, while the injected one is negative. The bias in the effective spin parameter is approximately -0.3 for the three models, indicating the inability of the quasicircular models to estimate the spin parameter of highly eccentric spinning binaries with quasicircular models. Regarding the recovered matchedfilter SNR and the log Bayes factor displayed in Table III, one can observe that while the SNR provides comparable values among models, the values of the log Bayes factor indicate that PhenomPv2 fits the data scarcely better than PhenomHM and PhenomD.

This section shows examples of the kind of study that one is able to perform with the current eccentric waveform dataset. We have shown the limitations of the current IMR quasicircular models to estimate the parameters of moderately eccentric waveforms, including a moderately spinning case. For the cases studied in this section, we have found that although the use of quasicircular models to estimate parameters of eccentric signals leads to inevitable biases, aligned-spin quasicircular models with higher order modes leverage the impact of these biases for the mass ratio and the luminosity distance when compared to aligned-spin models with only the $(2, \pm 2)$ modes or precessing models. Because of the computational cost of the PE runs and the amount of eccentric waveforms available, we leave for future work a detailed study of the whole dataset using not only quasicircular models but also eccentric waveform approximants.

V. SUMMARY AND CONCLUSIONS

In this paper we have presented the first parameter study of numerical relativity simulations of eccentric spinning black hole binaries. We have presented a simple procedure to set up the initial parameters of eccentric simulations. The higher the initial eccentricity of the simulation, the longer the initial separation has to be to avoid the immediate plunge of the binary due to the strong interactions at the periastron. This increases the computational cost of the simulations of Table IV with $e_0 \sim 0.4$, which is roughly double the one with $e_0 \sim 0.2$, as can be observed in their merger times. Additionally, longer initial separations produce long enough waveforms, which allows one to avoid the breakdown of the post-Newtonian approximation and ease the posterior construction of PN-NR hybrid waveforms. As part of the postprocessing step, we have computed the final mass and final spin of the 60 new simulations presented in Table IV. We have compared the final mass and final spin of those simulations with quasicircular NR fits [59] and found that relative differences are as high as 1%, which is completely consistent with the inaccuracies of the fitting formulas and gauge transient in the apparent horizon quantities. Therefore, we have extended previous work [53] on the circularization of eccentric nonspinning numerical relativity simulations to the eccentric spinning case. Note that the eccentricities of the simulations presented in this communication have more moderate values than the ones presented in [53], although ours are much longer and include spins.

A crucial part of this work has been to extend the low eccentric procedure to measure the eccentricity in NR [55] to the arbitrary high eccentric limit. We have shown that the eccentricity estimator used in [55] cannot be used for high eccentricities because it does not reduce to the Newtonian definition of the eccentricity. Additionally, its reliance on a noneccentric fit makes it numerically inaccurate, and it can produce eccentricity values higher than 1. As a consequence, we have decided to use another eccentricity estimator [68] that is also constructed upon the orbital frequency and which does not rely on any noneccentric fit. This eccentricity estimator reduces to the Newtonian definition of eccentricity for arbitrarily high eccentricities. We have shown that with this eccentricity estimator we are able to robustly measure the eccentricity for the whole evolution, which will be a key result for generating a future eccentric waveform model.

We have then taken the NR waveforms and hybridized the (2.2) mode with PN waveforms. The production of the eccentric PN waveforms has required to solve the point particle 3.5PN equations of motion in ADMTT coordinates [55] enhanced with the eccentric contribution to the energy flux from [71]. The absence of complete generic PN expressions for the waveform modes has caused the inaccuracy of the PN waveforms to dominate the error in the hybridization procedure. The use of the instantaneous terms at 3PN order [76] produces inaccurate waveforms due to the lack of low order tail terms, while the full 3PN expressions in [77] are restricted to the OK parametrization and rely on a certain decomposition of the dynamical variables, which complicates their combination with the generic numerical solution of the equations of motion (3.1). Therefore, we have restricted to the use of the quadrupole formula with a correction procedure for the initial orbital separation. We have developed a procedure which corrects the initial orbital separation of the PN evolution code for a certain δr such that it minimizes the difference in amplitude between the PN and NR (2,2) waveform modes. We have shown that with that procedure we are left with relative errors in the amplitude and phase below 1% in the hybridization region. These errors in amplitude and phase are high compared to the quasicircular ones [84], where the PN knowledge is wider. Therefore, we expect that in the future an improvement in knowledge about post-Newtonian waveforms will allow us to construct more accurate hybrid waveforms, not only for the (2,2) mode but also for the higher order modes.

We have also compared the hybrid waveforms with quasicircular IMR waveform models. This has been done by first computing the mismatch of the eccentric hybrid dataset against the quasicircular nonprecessing PhenomX model [22,23]. We find that the mismatches become much higher than 3% for binaries with a total mass lower than 100 M_{\odot} , while for total masses higher than 150 M_{\odot} the mismatch lowers below 3% due to the fact that most of the eccentric waveforms in the frequency band of the detector are in the merger-ringdown parts, which, as shown in Sec. II C, due to circularization agrees really well with the quasicircular model.

Additionally, we have made a set of injections into Gaussian detector noise colored to match the LIGO and Virgo design detector sensitivities. We have studied the parameter biases on recovered parameters when using quasicircular models as approximants. We have used three different quasicircular models to recover the parameters and have shown that, although the use of quasicircular models leads to inevitable biases in parameters like the effective spin parameter or the chirp mass, where the biases are similar among the three models, others like the mass ratio and the luminosity distance present lower biases when using quasicircular aligned-spin models including higher order modes. Another important feature is the correlation between chirp mass and mass ratio, the better the measurement of the chirp mass, the worse the determination of the mass ratio, and vice versa. This can be clearly observed in Figs. 9 and 13, where for initial eccentricities 0.09 the chirp mass is well measured for the three models but the mass ratio distributions are not. As the initial eccentricity increases, so does the shift in the chirp mass distribution, and the mass ratio is generally better determined. In the case of the spinning eccentric hybrid, the high initial eccentricity produces clear biases in all quantities and, unexpectedly, PhenomHM recovers the injected value of the mass ratio well and performs the best for the luminosity distance. The study of this phenomenology for the different cases that we have available is ongoing and we leave for a future communication the extension of these results to the whole parameter space.

The work presented in this communication is a natural extension of [55]. We have set up the current infrastructure of our group for quasicircular waveform modeling of the eccentric case. As shown in this paper, we have developed new methods to produce a set of spinning eccentric hybrid waveforms which can actually be used for data analysis purposes. The next natural step is to use this hybrid dataset

to produce a calibrated eccentric IMR waveform, which can be used for the detection and parameter estimation of eccentric black hole binaries.

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APPENDIX A: NUMERICAL RELATIVITY SIMULATIONS

The numerical setup for the BAM and EINSTEIN TOOLKIT codes is the same as that described in Appendix C of [55]. We present in Table IV the NR simulations we have produced for this publication. In Table IV we show the main properties of the NR simulations: from left to right we start providing an identifier to the simulations, the simulation name, the mass ratio $q = m_1/m_2 \ge 1$, the code used to produce it, the z component of the dimensionless spin vectors $\chi_{1,z}$, $\chi_{2,z}$ of each black hole, the initial orbital separation D/M, where M is the total mass of the system, the initial eccentricity e_0 corresponding to the eccentricity value used in Eq. (2.4) to compute the perturbation factors of the initial linear momenta of the simulations, the initial orbital eccentricity e_{ω} measured with Eq. (2.8) from the orbital frequency computed from the motion of the black holes, an eccentricity error estimate, δe_{ω} , computed using Eq. (2.9), the time to merger T_{merger}/M , calculated as the



FIG. 10. Eccentricity measured from the orbital frequency e_{ω}^X , with X = NS, -S, +S corresponding to nonspinning and positive and negative spin simulations, for all of the simulations in Table IV compared to the PN eccentricity e_0 specified in Eq. (2.4) to compute the perturbation factors for the initial linear momentum of the simulations. The black dots represent e_0 , the eccentricity value prescribed in Eq. (2.4), while the diamonds represent the actual measured eccentricity e_{ω}^X . For e_{ω}^X we distinguish nonspinning (X = NS), positive spin (X = +S), and negative spin (X = -S) simulations with blue, red, and green symbols, respectively.

time elapsed from the start of the simulation until the peak of the amplitude of the (l, m) = (2, 2) mode, the number of orbits, $N_{\text{orbits}} = \phi_{22}^M/(4\pi)$, where ϕ_{22}^M is the value of the phase of the (2,2) mode at merger, the final mass M_f as defined in Eq. (2.5), and the magnitude of the dimensionless final spin, $\chi_f = S/M_f$, where S is specified in Eq. (2.4).

In Fig. 10 we display the values of the eccentricity measured from the orbital frequency e_{ω} defined in Eq. (2.8), and the value of the eccentricity e_0 used in Eq. (2.4) to compute the perturbation factors of the initial linear momenta of the simulations in Table IV. Moreover, we distinguish for e_{ω} with blue, red, and green symbols indicating nonspinning and positive and negative spin simulations, respectively. As expected, we observe an increase in the differences between e_{ω} and e_0 with higher initial eccentricities and with high spins as the formula for $\lambda_t(r, e_0, \eta, \text{sign})$ where e_0 is used. Equation (2.2) is a 1PN expression derived for nonspinning binaries in the low eccentricity limit. To obtain better control on the initial eccentricity of the NR simulations for high eccentricities, higher order corrections, including spin effects, should be taken into account in the derivation of the correction factors for the initial linear momenta of the black holes. We leave for future work an extension of the current PN formulas to the high eccentricity limit.

APPENDIX B: ECCENTRICITY ESTIMATORS IN HIGHLY ECCENTRIC SYSTEMS

In this section we briefly show the form of the eccentricity estimators of Eqs. (2.7) and (2.8) in the Newtonian limit. We start analyzing the eccentricity estimator

$$e_{\omega}(t) = \frac{\omega(t) - \omega(e=0)}{2\omega(e=0)}.$$
 (B1)

In the Keplerian parametrization the orbital frequency can be written as

$$\omega(t) = \frac{n_t \sqrt{1 - e^2}}{(1 - e \cos u)^2},$$
 (B2)

where $n_t = 2\pi/T_{\text{orb}}$ is the mean motion, T_{orb} is the orbital period, *e* is the eccentricity, and *u* is the eccentric anomaly. In the low eccentric limit, Eq. (B1) reduces to

$$\omega(t) \approx n_t [1 + 2e \cos u] + \mathcal{O}(e^2). \tag{B3}$$

Replacing Eq. (B3) in Eq. (B1), one obtains $e_{\omega} = e$. However, if one substitutes Eq. (B2) into Eq. (B1) one gets

$$e_{\omega}(t) = \frac{1}{2} \left(\frac{\sqrt{1 - e^2}}{[e \cos(u) - 1]^2} - 1 \right),$$
 (B4)

which does not reduce to the Newtonian definition of eccentricity. Moreover, one can show that the estimator of Eq. (B4) is not normalized for a certain combination of values of *u* and *e*. For example, if *u* vanishes, then

$$e_{\omega} \ge 1$$
 for $e \ge 0.455212$. (B5)



FIG. 11. Posterior probability distributions of the mass ratio and the chirp mass for the injected eccentric NR simulations in Table I and the zero-eccentricity injection with the NRHyb-Sur3dq8 model, using IMRPhenomD as the approximant. The vertical dashed lines correspond to 90% credible regions. The dark blue thick vertical line represents the injected value. The black, red, blue, and green curves represent injections with initial eccentricities $e_0 = 0$, 0.09, 0.14, 0.2, respectively.



FIG. 12. Posterior probability distributions of χ_p for the injected NR simulations in Table I. The vertical dashed lines correspond to 90% credible regions. The magenta thick vertical line represents the injected value. The black, blue, and red curves represent injections with initial eccentricities $e_0 = 0.09$, 0.14, 0.2. All cases are sampled using as the approximant IMRPhenomPv2.

This shows that the eccentricity estimator given by Eq. (B1) has to be taken with caution in the high eccentric limit because it can go above 1. On the other hand, the eccentricity estimator

$$e_{\Omega_{a,p}}(t) = \frac{\omega_p^{1/2} - \omega_a^{1/2}}{\omega_p^{1/2} + \omega_a^{1/2}},$$
 (B6)

where ω_a , ω_p are the orbital frequencies at the apastron and periastron, respectively. This eccentricity estimator has the property such that, even for high eccentricities, it reduces to the Newtonian definition of eccentricity, i.e., $e_{\Omega_{a,p}} = e$.

APPENDIX C: POSTERIOR DISTRIBUTIONS

In this Appendix we provide further information about the parameter estimation methods used and posterior distributions of several relevant quantities. The settings of the CPNest sampler [92] are a number of live points $N_{\text{live}} = 16824$ and a maximum number of Markov-chain Monte Carlo (MCMC) steps to take max-mcmc = 5000. We refer the reader to [103] for details on the meaning of those parameters in the context of nested sampling. This is a computationally expensive setup aiming to ensure an accurate sampling of the likelihood given the complexity of the signal.

We show in Fig. 11 a contour plot of the mass ratio and chirp mass posterior distributions for the injected eccentric NR simulations in Table I and the zero-eccentricity injection with the NRHybSur3dq8 model recovered with



FIG. 13. Posterior probability distributions for the eccentric injected NR simulations in Table I. The vertical dashed lines correspond to 90% credible regions. The magenta thick vertical line represents the injected value. The black, blue, and red curves represent distributions sampled using the IMRPhenomD, IMRPhenomHM, and IMRPhenomPv2 approximants, respectively. With increasingly high opacity injections are represented with initial eccentricities $e_0 = 0.09$, 0.14, 0.2.

PhenomD. This plot explicitly exhibits the correlation between the bias in the measurement of the chirp mass and the narrowing of the posterior for the mass ratio with increasing initial eccentricity.

For completion we also show in Fig. 12 the posterior distribution of the χ_p parameter for the NR simulations in Fig. 1 run with IMRPhenomPv2. This parameter, defined in [104], accounts for the spin components orthogonal to the direction of the orbital angular momentum vector of the system. Therefore, for nonprecessing configurations $\chi_p = 0$, and for precessing configurations χ_p ranges between 0 and 1. In Fig. 12 one can observe an increase in χ_p with increasing initial eccentricity of the injected

signal. This result means that the precessing waveform IMRPhenomPv2 is trying to compensate for the inability to reproduce the eccentric signal incrementing the value of the χ_p parameter, i.e., increasing the precession.

In Fig. 13 we display the posterior probability distributions of the chirp mass, mass ratio, effective spin parameter, and luminosity distance for the eccentric injected NR simulations in Table I recovered with the IMRPhenomD, IMRPhenomHM, and IMRPhenomPv2 approximants with 90% credible intervals specified by the dashed lines and the injected values by the magenta thick vertical lines. The fainter the color of the posterior distributions, the lower the initial eccentricity ($e_0 = 0.09, 0.14, 0.20$).

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