# A New Method to Constrain Neutron Star Structure from Quasi-periodic Oscillations 

<br>${ }^{1}$ Dipartimento di Fisica, "Sapienza" Università di Roma \& Sezione INFN Roma1, Piazzale Aldo Moro 5, I-00185, Roma, Italy<br>${ }^{2}$ Department of Physics, Aristotle University of Thessaloniki, 54124 Thessaloniki, Greece<br>${ }^{3}$ University of Oxford, Department of Physics, Astrophysics, Denys Wilkinson Building, Keble Road, OX1 3RH, Oxford, UK<br>${ }^{4}$ INAF-Osservatorio Astronomico di Roma, via Frascati 33, I-00078, Monteporzio Catone, Roma, Italy<br>Received 2019 May 24; revised 2020 June 12; accepted 2020 June 22; published 2020 August 24


#### Abstract

We develop a new method to measure neutron star (NS) parameters and derive constraints on the equation of state (EoS) of dense matter by fitting the frequencies of simultaneous quasi-periodic oscillation (QPO) modes observed in the X-ray flux of accreting NSs in low-mass X-ray binaries. To this aim, we calculate the fundamental frequencies of geodesic motion around rotating NSs based on an accurate general-relativistic approximation for their external spacetime. Once the fundamental frequencies are related to the observed frequencies through a QPO model, they can be fit to the data to obtain estimates of the three parameters describing the spacetime, namely the NS mass, angular momentum and quadrupole moment. From these parameters we derive information on the NS structure and EoS. We present a proof of principle of our method applied to pairs of kHz QPO frequencies observed from three systems (4U1608-52, 4U0614+09, and 4U1728-34). We identify the kHz QPOs with the azimuthal and the periastron precession frequencies of matter orbiting the NS, and via our Bayesian inference technique we derive constraints on the neutrons stars' masses and radii. This method is applicable to other geodesic-frequency-based QPO models.


Unified Astronomy Thesaurus concepts: Neutron stars (1108); Low-mass x-ray binary stars (939);
Gravitation (661)

## 1. Introduction

Neutron stars (NSs), the densest stable stellar objects in the universe, provide key information on the properties of cold, supranuclear density matter, strong gravitational fields, and a variety of astrophysical processes that take place in or around them. Observations of NSs extend over the entire electromagnetic spectrum, from radio frequencies to gamma-rays. The recent detection of gravitational waves (GWs) from two coalescing NSs has opened another, entirely different, observational window. Combinations of measurements of NS parameters such as mass, radius, moment of inertia, angular frequency, tidal deformability, or quadrupole moments, which have already been obtained (or are within reach of present and future instrumentation), hold the potential to constrain the equation of state (EoS) of dense matter and the structure of NSs to high precision and accuracy (see e.g., Lattimer \& Prakash 2007; Hinderer et al. 2018). To this aim, different methods exploiting different diagnostics have been pursued: for instance X-ray based methods have been devised to infer the mass and radius of NSs from the evolution of radius expansion Type I X-ray bursts, broadened Fe K $\alpha$ line profiles, fastest rotation frequencies, and periodic modulations resulting from NS rotation (for a review see Watts et al. 2016; Lattimer 2019). NICER X-ray observations of a rotation-powered NS have recently provided $\sim 8 \%-12 \%$ precise mass and radius measurements, based on the latter method (Miller et al. 2019; Riley et al. 2019). Constraints on the EoS of NSs have recently been obtained also from the GW signal of GW170817 (Abbott et al. 2018). Present limitations in the determination of the EoSs of NSs arise from data paucity and/or quality (insufficient sensitivity and signal-to-noise ratio especially), modeling uncertainties and control of systematics.

The fast quasi-periodic oscillations (QPOs) in the X-ray flux of NS low-mass X-ray binaries are among the observables that can yield measurements of NS mass and radius. These signals
appear as narrow features in the power spectra of the light curves of accreting NSs and black holes. While their interpretation is still debated, QPOs are believed to be produced in the inner regions of the accretion disk surrounding the compact object. They often display different modes, some of which are excited at the same time, and undergo correlated frequency changes (for a review see van der Klis 2006). Much of what is currently known about QPOs derives from observations with the Rossi X-Ray Timing Explorer (RXTE; Swank et al. 1995). RXTE detected a large number of lowfrequency QPOs (LFQPOs, observed below several tens of Hz ) and enabled the discovery of high-frequency QPOs, often observed in pairs, with frequencies up to over a kHz in NS systems (the upper and lower kHz QPOs).

Following the realization that kHz QPO frequencies are close to dynamical frequencies around compact objects (Strohmayer et al. 1996; van der Klis et al. 1996), the potential of QPOs for diagnosing matter motion in strong gravitational fields became apparent. This stimulated the development of models involving the innermost regions of accretion flows where general-relativistic departures from Newtonian gravity are large (see e.g., Belloni \& Stella 2014). In a generic model that has been widely adopted since, the upper kHz QPO signal is directly associated to the azimuthal frequency of matter orbiting in the inner disk region, as Syunyaev (1973) and others had suggested decades earlier. More complex local models aiming at interpreting other QPO modes, the LFQPOs and the lower kHz QPO in particular, were soon proposed, building on the idea that QPOs are excited at a specific radius in the disk. Among these are the Relativistic Precession Model (RPM; Stella \& Vietri 1998, 1999) and the Epicyclic Resonance Model (ERM; Abramowicz \& Kluzniak 2001; Kluzniak \& Abramowicz 2001, 2002; Fragile et al. 2016). The frequencies of the signals predicted for different QPO modes consist of
combinations of the fundamental frequencies $\nu_{\phi}, \nu_{\theta}$, and $\nu_{r}$ of quasi-circular geodesics in the strong-field regime. Also QPO models involving global oscillations of the inner disk, such as g- and p-modes (Nowak \& Wagoner 1992, 1991; Nowak et al. 1997; Wagoner et al. 2001; Kato 2004, 2012a, 2012b) and corrugation and warping modes (Markovic \& Lamb 1998; Armitage \& Natarajan 1999; Kato 2001) predict frequencies related to the frequencies of geodetic motion.

As geodesics are determined by the spacetime metric, the above QPO models as well as models that extend them in different ways (see e.g., Török et al. 2012; Stuchlík \& Kološ 2016 and reference therein) hold the potential to probe the spacetime itself and measure key parameters of the compact object. In applications to black holes, the Kerr spacetime is generally used. The varying frequencies of two (and in one case three) QPO modes measured from a few black-hole transients were successfully fit to the frequencies predicted by the RPM, and black-hole mass and spin inferred (Motta et al. 2014a, 2014b). Similarly the $3: 2$ frequency ratio in some black-hole QPOs were exploited in the ERM to infer black-hole parameters (e.g., Török et al. 2005). The spacetime around rotating NSs is more complex, as it is characterized by mass, angular momentum, and higher order multipole moments. Analytical approximations to the fundamental frequencies of geodesic motion around NSs were used in early applications of the RPM (e.g., Stella \& Vietri 1998). Other studies adopted instead the numerically calculated spacetimes around rotating NS models, for selected EoSs (Morsink \& Stella 1999; Stella et al. 1999).

In this paper we introduce a general method to compute geodesic motion in the strong-field spacetimes generated by NSs, which builds on the finding that higher order multipole moments of NSs are related, to a good approximation, by some "three-hair relations" (Pappas \& Apostolatos 2014; Stein et al. 2014; Yagi et al. 2014; Yagi \& Yunes 2017). In this framework, fundamental frequencies of geodesic motion can be computed for any stationary and axisymmetric spacetime once the mass, angular momentum, and quadrupole moment are specified (for some additional applications, see Maselli et al. 2015a, 2015b). These frequencies can then be used within QPO models to fit the observed QPO frequencies, test the assumptions of any given model (such as, e.g., the association of certain predicted frequencies with a given set of QPOs), and ultimately measure NS parameters that can be translated into constraints to the EoS. An explicit form of the spacetime metric in terms of mass, angular momentum, and higher order multipole moments has been derived by Pappas (2017). ${ }^{5}$ Such a metric enables us to reproduce the orbital features of rotating NSs computed in fully relativistic numerical simulations up to the innermost stable circular orbit, with better than $1 \%$ accuracy (Pappas 2017). In this work we adopt the above metric, which enables us to extend previous work on NS QPOs using analytic spacetimes (Pappas 2012, 2015, 2017; Pappas \& Apostolatos 2013; Tsang \& Pappas 2016).

Our aim is to measure/constrain the NS parameters by modeling the QPOs in the X-ray light curve of accreting NS binaries, making use of an accurate description of the NS surrounding spacetime. In this paper we present a first application of a new method to do so that differs from similar

[^0]methods previously proposed in the use of (i) an accurate metric to describe the spacetime of rapidly rotating NSs, (ii) a Bayesian inference technique, which yields better constraints as the number of QPOs considered increases as it can take into account the information of all the QPOs considered at the same time. We use QPOs measured with RXTE from NS low-mass X-ray binaries (LMXBs) with known rotation period (from oscillations observed during type-I X-ray bursts, see, e.g., Watts 2012). We considered the sample of van Doesburgh \& van der Klis (2017), and selected three sources with a large number of QPO triplets (i.e., two kHz QPOs and an LFQPO observed simultaneously), namely 4U1608-52, 4U0614+09, and 4U1728-34.

Here we consider only the twin kHz QPOs; in a follow-up paper (A. Maselli et al. 2020, in preparation) we will report on the results obtained by considering QPO triplets. We follow the prescriptions of, e.g., the RPM, and we identify the upper and lower kHz QPOs with the azimuthal frequency $\nu_{\phi}$, and the periastron precession frequency, $\nu_{\text {per }}=\nu_{\phi}-\nu_{r}$ (Stella \& Vietri 1999). ${ }^{6}$ The two QPO signals (three, when a third QPO is considered) are assumed to be generated at the same orbital radius. Correlated QPO frequency variations are thus the result of variations in the radius at which the QPOs are emitted (see also Motta et al. 2014a).

In this paper we shall use geometric units $G=c=1$. The mass will be expressed either in kilometers, or in solar masses $M_{\odot}=1.4768 \mathrm{~km}$.

## 2. The Metric for a Rotating NS

The metric around a rotating NS is expressed as a stationary and axisymmetric spacetime; it can be parameterized in terms of the first five relativistic multipole moments (Geroch 1970a, 1970b; Hansen 1974; Fodor et al. 1989), i.e., the mass $M$, the angular momentum $J$, the mass quadrupole $M_{2}$, the spin octupole $S_{3}$, and the mass hexadecapole $M_{4}$ (Pappas 2017). The line element for such a spacetime can be written as (Papapetrou 1953),

$$
\begin{equation*}
d s^{2}=f^{-1}\left[e^{2 \zeta}\left(d \rho^{2}+d z^{2}\right)+\rho^{2} d \varphi^{2}\right]-f(d t-\omega d \varphi)^{2} \tag{1}
\end{equation*}
$$

where $(\rho, z)$ are the Weyl-Papapetrou coordinates and the metric components $f, \omega$, and $\zeta$, shown in Appendix A, are functions of the multipole moments and of the coordinates $(\rho, z){ }^{7}$

To adjust the spacetime to the stellar structure of the central object, the right set of multipole moments must be specified. Recent work (Pappas \& Apostolatos 2014; Yagi et al. 2014) has shown that for NSs the first few relativistic multipole moments can be expressed as,

$$
\begin{equation*}
M_{2}=-\alpha j^{2} M^{3}, \quad S_{3}=-\beta j^{3} M^{4}, \quad M_{4}=\gamma j^{4} M^{5} \tag{2}
\end{equation*}
$$

where $M$ is the mass and $j=J / M^{2}$ is the spin parameter, with $J$ being the angular momentum of the star. For NSs the coefficients $\alpha, \beta$, and $\gamma$ can be much larger than 1 , in contrast to Kerr black holes (see Doneva et al. 2018 for a review). Furthermore it has been shown that for realistic EoSs, based on microphysical calculations, the higher order NS multipole moments (higher

[^1]than $M_{2}$ ) can be expressed in terms of the quadrupole, angular momentum, and mass (Pappas \& Apostolatos 2014; Stein et al. 2014; Yagi et al. 2014; we refer the reader to Pappas 2017 for a detailed discussion). The spin octupole and the mass hexadecapole of an NS are related to the quadrupole by the relations ${ }^{8}$
\[

$$
\begin{gather*}
y_{1}=-0.36+1.48 x^{0.65}  \tag{3}\\
y_{2}=-4.75+0.28 x^{1.51}+5.52 x^{0.22} \tag{4}
\end{gather*}
$$
\]

where $y_{1}=\sqrt[3]{-\bar{S}_{3}}=\sqrt[3]{\beta}, y_{2}=\sqrt[4]{\bar{M}_{4}}=\sqrt[4]{\gamma}, x=\sqrt{-\bar{M}_{2}}=$ $\sqrt{\alpha}$, and $\bar{M}_{n}=\frac{M_{n}}{j^{n} M^{n+1}}, \bar{S}_{n}=\frac{S_{n}}{j^{n} M^{n+1}}$ are the (dimensionless) reduced moments. For NSs $\alpha$ varies in the range between 1.5 and 10 for masses between $1 M_{\odot}$ and up to the maximum mass (which is different for each EoS), where smaller values correspond to larger masses.

Therefore, the description of the spacetime and of the various geodesic frequencies will only depend on three parameters: the mass $M$ (that we express in units of kilometers in $G=c=1$ units), the dimensionless spin parameter $j$, and the dimensionless reduced quadrupole $\alpha \equiv-\bar{M}_{2}$. This is especially relevant for our analysis, as it reduces the number of parameters to be constrained.

By relating QPO frequencies to geodesic frequencies through the adoption of a given model (the RPM in our present case), the mass $M$, reduced spin $j$ and reduced quadrupole moment $\alpha$ can be measured as independent parameters determining the characteristics of the spacetime. These three parameters, if measured precisely, provide constraints on the NS EoS. This top-down approach involves no a priori assumption on the EoS and contrasts with other studies in which geodesic frequencies are compared to QPO frequencies based on the spacetime calculated for individual EoS and specific values of $M$ and $j$ (see e.g., Morsink \& Stella 1999; Török et al. 2016)

The spacetime considered in this work is equivalent to that introduced in Pappas (2017) and valid for all rotation rates (see Appendix A for technical details). Our metric is different and more accurate than slowly rotating approaches, such as the second order Hartle-Thorne spacetime (see Urbancova et al. (2019) for recent and detailed analyses using this approach). It extends previous work on NS QPOs based on analytic spacetimes (Pappas 2012, 2015, 2017; Pappas \& Apostolatos 2013; Tsang \& Pappas 2016). The accuracy of the epicyclic frequencies used in this paper has been tested against fully numerical solutions showing an agreement better than $99 \%$ down to the innermost stable circular orbit (Pappas 2017), which outperforms the approaches described above.

## 3. Numerical Analysis

In order to test our method with the QPO frequencies from the sources in our sample we adopted a Bayesian approach. For a given set of $n$ observations $\boldsymbol{O}$ we wish to determine the posterior probability distribution of the system's parameters $\boldsymbol{\theta}=\left(r_{i=1, \ldots n}, M, j, \alpha\right)$, i.e.,

$$
\begin{equation*}
\mathcal{P}(\boldsymbol{\theta} \mid \boldsymbol{O}) \propto \mathcal{P}_{0}(\boldsymbol{\theta}) \mathcal{L}(\boldsymbol{O} \mid \boldsymbol{\theta}) \tag{5}
\end{equation*}
$$

[^2]Table 1
Numerical Coefficients of the Empirical Relation (7), which Provides the NS Circumferential Radius as a Function of the Dimensionless Spin Parameter and of the Stellar Quadrupole

|  | $\ell=0$ | $\ell=1$ | $\ell=2$ |
| :--- | :---: | :---: | :---: |
| $A_{\ell}$ | 0.00927584 | -0.0252801 | 0.0497335 |
| $B_{\ell}$ | -0.358824 | 3.15892 | -5.30171 |
| $C_{\ell}$ | 2.94923 | -3.20369 | 6.02522 |

Note. The best-fit values for the exponents $\mathcal{N}_{1,2}$ are given by $\mathcal{N}_{1}=4.12566$ and $\mathcal{N}_{2}=0.996284$ (Pappas 2015).
where $\mathcal{P}_{0}(\boldsymbol{\theta})$ represents the prior information on the parameters. $\mathcal{L}(\boldsymbol{O} \mid \boldsymbol{\theta})$ is the likelihood function, which we assume proportional to a chi-square variable, $\mathcal{L} \propto e^{-\frac{1}{2} \chi^{2}}$, given by:

$$
\begin{equation*}
\chi^{2}=\sum_{i=1}^{N_{\mathrm{obs}}}\left(\frac{\Delta_{\phi}^{2}}{\sigma_{\nu_{\phi}}^{2}}+\frac{\Delta_{\mathrm{per}}^{2}}{\sigma_{\nu_{\mathrm{per}}}^{2}}\right), \tag{6}
\end{equation*}
$$

where $N_{\text {obs }} \geqslant N_{\min }, \Delta_{k} \equiv \nu_{k}^{\text {obs }}-\nu_{k}(\boldsymbol{\theta})$, and $\nu_{j}$ can be either the azimuthal or the periastron precession frequency.

Since we use here only pairs of kHz QPO frequencies ("doublets"), each source provides $2 N_{\text {obs }}$ frequencies, which are used to determine $3+N_{\text {obs }}$ unknown parameters, i.e., the NS parameters $(M, j, \alpha)$ and the circumferential radii $r_{i}$ where each is produced. Thus, we need at least $N_{\text {min }}=3$ doublets to characterize each source. As the errors of the QPO observed frequencies are in general asymmetric (see Table B1), i.e., $\nu_{j}=\nu_{j}^{\mathrm{obs}} \pm \sigma_{\nu_{j}}^{( \pm)}$, with $\sigma_{\nu_{j}}^{(+)} \neq \sigma_{\nu_{j}}^{(-)}$, for the sake of simplicity we compute the chi-square functions of Equation (6) by using their $\sigma_{\nu_{j}}=\left[\sigma_{\nu_{j}}^{(+)}+\sigma_{\nu_{j}}^{(-)}\right] / 2$. This has a negligible effect on inferred values of the source parameters. Moreover, given the accuracy of our metric, the relative difference between the actual frequencies and those computed using (1) is subdominant with respect to the observational errors, and therefore it will be neglected in our analysis (Pappas 2017).

We sample the posterior distribution (5) using a Markov Chain Monte Carlo (MCMC) approach, based on the Metro-polis-Hastings algorithm (Gilks et al. 1996). The random jump within the parameter space is chosen according to a multivariate Gaussian distribution, whose covariance matrix is continuously updated through a Gaussian adaptation scheme (Müller \& Sbalzarini 2010), which increases the mixing of the chains and boosts the convergence to the target distribution. For each set of data, we run four independent chains of $2 \times 10^{6}$ samples, generally discarding the first $10 \%$ of the simulation as a burn in. The convergence of the processes is then assessed by a standard Rubin test.

We consider flat prior distributions for all the parameters within the following ranges: $M \in[0.7,3] M_{\odot}, j \in[0,0.7]$, $\alpha \in[1.5,15], r_{i} \in\left[R_{\mathrm{NS}}, 15 M\right]$. Note that the prior on $\chi$ allows only co-rotating orbital motion. We also set the prior on $r_{i}$ such that it is always larger than the stellar equatorial circumferential radius $R_{\text {NS }}$. The latter can be expressed with very good accuracy (a few percent) as a function of $M, j$, and $\alpha$ :

$$
\begin{equation*}
R_{\mathrm{NS}} / M=\sum_{i=0}^{3}\left[\mathcal{B}_{i} j^{i}+\mathcal{A}_{i} j^{i} \alpha^{\mathcal{N}_{1} / 2}+\mathcal{C}_{i} j^{i} \alpha^{\mathcal{N}_{2} / 2}\right] \tag{7}
\end{equation*}
$$

were the numerical coefficients $\left(\mathcal{B}_{i}, \mathcal{A}_{i}, \mathcal{C}_{i}, \mathcal{N}_{1}, \mathcal{N}_{2}\right)$ are listed in Table 1.


Figure 1. Marginalized posterior probabilities of $(M, j, \alpha)$ for $4 \mathrm{U} 1608-52$ derived by using different groupings of three QPO doublets drawn from the observed frequencies ( $\nu_{\phi}, \nu_{\text {per }}$ ) in Table B1.

Once the $\mathcal{P}(\boldsymbol{\theta} \mid \boldsymbol{O})$ is sampled by the MCMC, we derive the probability distribution of the source parameters, by marginalizing the joint posterior distribution over the emission radii:

$$
\begin{equation*}
\mathcal{P}(M, \chi, \alpha)=\int \mathcal{P}(\boldsymbol{\theta} \mid \boldsymbol{O}) d r_{1} \ldots d r_{n} \tag{8}
\end{equation*}
$$

In the following sections we apply this analysis to the kHz QPO of 4U1608-52, 4U0614+09, 4U1728-34, and compute $\mathcal{P}(M, \chi, \alpha)$ using various combinations of the doublets for each source, (see Appendix B, Table B1). The latter step is crucial to our analysis as it provides a selfconsistency test for the applicability of the RPM in conjunction with the geodesic frequencies calculated in our method. If the assumptions of the method are correct, different sets of doublets for a given source must necessarily provide probability distributions for masses, spins, and quadrupole moments that are consistent with each other to within the uncertainties. On the contrary, an inconsistency of the different probability distributions would signal problems with the adopted geodesic and/or QPO model.

## 4. Results

Since we analyzed kHz QPOs doublets, i.e., the QPOs in the RPM correspond to the periastron and the azimuthal frequencies, the MCMC requires for each source at least three sets of QPO frequencies, each containing the QPO doublet relevant for the model, i.e., $\left(\nu_{\phi}, \nu_{\text {per }}\right)_{i=1,2,3}$, to be solved in terms of $(M, \alpha, j)$ and three emission radii $\left(r_{1}, r_{2}, r_{3}\right)$. Therefore, for each source, we randomly selected subsets of three doublets from the available data. Figure 1 shows the posterior probabilities obtained for different sets of doublets, while the associated numerical values are reported in Table 2. As a representative case, we describe in detail the results we obtained for 4U1608-52.

The posterior distributions obtained by using different data sets are in good agreement with each other, and the different parameter distributions are all remarkably consistent (even though in some cases shifts between the peaks of the different marginal distributions are apparent). However the quadrupole moment of the star remains essentially unconstrained, its probability distributions being almost flat between $\alpha \simeq 1.5$

Table 2
Median and $90 \%$ Values for the Parameters of the Sources Analyzed

| Source | $M / M_{\odot}$ | $j$ | $\alpha$ |
| :--- | :---: | :---: | :---: |
| $4 \mathrm{U} 1608-52$ | $2.07_{-0.15}^{+0.25}$ | $0.10_{-0.10}^{+0.16}$ | $2.56_{-1.06}^{+0.74}$ |
| $4 \mathrm{U} 0614+09$ | $2.10_{-0.27}^{+0.45}$ | $0.20_{-0.24}^{+0.20}$ | $2.22_{-0.68}^{+1.04}$ |
| $4 \mathrm{U} 1728-34$ | $2.11_{-0.34}^{+0.47}$ | $0.27_{-0.27}^{+0.24}$ | $2.00_{-0.46}^{+1.18}$ |

and $\alpha \simeq 4$. This is to be expected for two reasons: first, the quadrupole moment gives a sub-leading contribution to the spacetime metric relative to mass and spin; and second, the effect of the quadrupole moment is largest on the $\nu_{\text {nod }}$ frequencywhich we do not consider in this work-while $\nu_{\phi}$ and $\nu_{\text {per }}$ are only weakly affected by its variation. However, it should be noted that adopting the approach described here with a larger set of QPO doublets would allow the quadrupole moment to be better constrained. The box plot shown in Figure 2 supports the use of our approach together with the RPM model: it is clearly seen that the median of the distributions are all consistent with each other, and the interquartile ranges overlap with good accuracy.

Motivated by the above results, we performed the same Bayesian analysis by progressively increasing the number of doublets. We found that in all cases the posterior distributions are consistent and yield acceptable parameters. We show the results of these steps in the triangle plot in Figure 3. The diagonal and off-diagonal panels show the marginalized and the 2D joint distributions of $M, j$, and $\alpha$, respectively. The mass is the parameter that we determine with the highest precision: at $90 \%$ confidence level ${ }^{9}$ we find $M \in[1.92,2.32] M_{\odot}$, with a median of $M=2.07 M_{\odot}$.

Our analysis also provides a poorly constrained spin parameter with median $j=0.1$ within the $90 \%$ interval $j \in$ [ $0,0.26$ ]. The 2D distributions of Figure 3 show some degree of positive correlation between $j$ and $M$. The inclusion of all data sets does not modify significantly the constraints on $\alpha$, for which we still obtain a flat posterior distribution within

[^3]

Figure 2. Box and whiskers plots for $(M, j, \alpha)$, corresponding to the probability distributions shown in Figure 1. White vertical lines in each colored box mark the median of the parameters. The edges of the box identify the upper and lower quartiles, while the ends of the whiskers yield the maximum and minimum inferred values.
$\alpha \in[1.50,3.30]$ at $90 \%$ (see the bottom row of Figure 3). In fact the values of the quadrupole sampled by the Monte-Carlo simulation are essentially degenerate with respect to $M$ and $j$. As noted above, this result is somewhat expected as the azimuthal and periastron precession frequencies depend weakly on $\alpha$.

The MCMC also leads to constraints on the orbital radius associated with each doublet in the analysis. We find values $r_{i} / M \lesssim 7$ in all cases. Figure 4 shows the the $90 \%$ confidence intervals for the seven values. As noted in applications of simple geodesic models (e.g., Miller et al. 1998) upper limits on the QPO radius derived the from the highest observed QPO frequencies provide an upper bound on the stellar radius. Requiring that the oscillations are generated within the accretion disk at orbital distances larger than $R_{\text {NS }}$ yields the limit $R_{\mathrm{NS}} \lesssim 6.4 M$ at $90 \%$ confidence level from the highestfrequency Doublet of 4U1608-52 (see $r_{6}$ in Figure 4).

The analysis of the kHz QPOs of $4 \mathrm{U} 0614+09$ and 4U1728-34 yields similar results to that of the 4U160852 kHz QPOs. Figure 5 shows that also for these systems there exists a general agreement of the inferences from different subsets of doublets, with 4U1728-34 displaying the largest spread in the posterior distributions of the parameters when the full set of doublets is taken into account. 4U0614+09 and 4U1728-34 are also characterized by a mass distribution that peaks around $\sim 2 M_{\odot}$. The posteriors of $M$ are shown in Figure 6; different groupings of doublets appear to give consistent results for each system and converge to a similar distribution. These are fairly large mass values compared to those typically derived for, e.g., isolated pulsars (Özel et al. 2012), but we note that other studies recovered similarly large NS masses (e.g., Stella \& Vietri 1999; Török et al. 2012). The quadrupole moments inferred for these two systems would suggest more compact objects (i.e., with larger values of $M / R$ ) with faster rotation rates with respect to 4U1608-52, although we stress that the inferred spin parameters are not very well constrained. The median of all parameters for each source, together with $90 \%$ uncertainties, are reported in Table 2.
The values of $(M, j, \alpha)$ provide an estimate for the NS equatorial radius through (7). We used the values we determined from the analysis of the full set of doublets of 4U1608-52, 4U0614+09, and 4U1728-34 to build the joint 2D distribution of $\mathcal{P}\left(M, R_{\mathrm{NS}}\right)$. The contour plot of Figure 7 shows the $90 \%$ region of the massradius posteriors of the three sources. Figure 7 shows also the expected mass-radius relations for three hadronic EoSs (APR, Akmal et al. 1998; SLy4, Douchin \& Haensel 2001; and UU,

Wiringa et al. 1988), which are all consistent with current constraints from X-ray observations (Ozel \& Freire 2016; Miller et al. 2019; Raaijmakers et al. 2019; Riley et al. 2019) as well as GW data (Abbott et al. 2018). They are also consistent with the most recent results inferred by the NICER experiment from observations of a rotation-powered pulsar (Miller et al. 2019; Raaijmakers et al. 2019; Riley et al. 2019).

## 5. Discussion and Conclusions

Based on an analytic description of the spacetime around an NS in terms of three independent parameters (mass, spin, and quadrupole moment), we developed a novel method to calculate accurately the frequencies of geodesic motion in the closest vicinity of the star, without resorting to a specific EoS, but instead adopting priors to our treatment that only allow specific parameter ranges for an unspecific EoS. Once these frequencies are related to the QPO frequencies observed in low-mass X-ray binaries through a QPO model, they can be fit to the data in order to obtain estimates of the NS mass, spin, and quadrupole moment, from which, in turn, an estimate of the NS radius and mass can be derived. This provides constraints to the EoS, and in principle can inform models of supranuclear density matter in a complementary way to other X-ray based techniques.

We presented a proof of principle of the method in application to the observed pairs of kHz QPO frequencies (doublets) in three systems (4U1608-52, 4U0614+09 and 4U1728-34) by applying the QPO frequency identification proposed, for instance in the RPM (Stella \& Vietri 1999). Through a Bayesian analysis we obtained mass estimates around $\sim 2.05-2.16 M_{\odot}$, close to (but not exceeding) the maximum of the observed distribution of NS masses (Lattimer 2019).
Our results appear to favor stiff EoSs, i.e., large NS masses and relatively large NS radii, as indicated by the marginalized distributions (see Figure 7). Our method yields relatively low values of the spin parameter $j$, all strictly smaller than 0.3 . One may ask, how is it possible to produce any constrains on the parameter $\alpha$, since the geodesic frequencies used are such weak functions of that parameter? This is due to the fact that the spin $j$ and $\alpha$ also determine both the equatorial radius of the star and the innermost stable circular orbit (ISCO). This means that the radius where the orbital motion occurs is limited by either the ISCO or the surface of the star, which limits the possible range of frequencies. These limitations in turn result in constraints on the parameters $j$ and $\alpha$.


Figure 3. Triangle plot for the posterior of the parameters of 4U1608-52. Diagonal and off-diagonal panels refer to marginalized and 2D joint posterior distributions, respectively. Dashed and solid curves identify contours at $68 \%$ and $90 \%$ confidence intervals, while colored dots represent the actual points sampled by the MCMC.


Figure 4. Ninety percent credible interval for the posterior distribution of the QPO radius for the doublets of 4U1608-52.

Once the values of $\alpha, j$, and $M$ are known, we can derive the probability distribution of the NS rotation rate $f$. To this aim we use the semi-analytic fit derived in Pappas (2015; see their Equation (B1) and Discussion). Due to the poor constraints on the quadrupole moment $\alpha$, the resulting bounds on $f$ are rather loose. We find that $f$ is constrained at $90 \%$ confidence interval within $\sim[0,582] \mathrm{Hz}(f \sim[0,739] \mathrm{Hz}$ at $95 \%$ confidence level) and $\sim[20,1000] \mathrm{Hz}(f \sim[18,1100] \mathrm{Hz}$ at $95 \%$ confidence level) for 4U1608-52 and 4U0614+09. $f$ is unconstrained for 4U1728-34, for which we have a nearly flat distribution between 0 and 1000 Hz . These values are consistent (marginally, in the case of 4U1608-52) with previous estimates of the NS spin frequencies for the above binary systems, i.e., $f \approx 620 \mathrm{~Hz}$, $f \approx 415 \mathrm{~Hz}$ and $f \approx 363 \mathrm{~Hz}$, respectively (Watts 2012). We stress that with this work being a proof of concept, we decided to adopt priors with only weak limitations in order to assess the goodness of our approach. If additional information, chiefly the NS rotation period, were included as a prior in the analysis, significantly tighter bounds would result. A precise determination of the NS mass, moment of inertia, and quadrupole moment that can be obtained in this way would provide an unprecedented


Figure 5. Same as in Figure (2), but for 4U0614+09 (top) and 4U1728-34 (bottom).


Figure 6. Posterior distributions for the mass of the binary systems $4 \mathrm{U} 0614+09$ and $4 \mathrm{U} 1728-34$. Dashed curves refer to different grouping of kHz QPO doublets, whereas the solid black lines are obtained by fitting all doublets for each source.
three-parameter constraint on the EoS, for which suitable 3D mappings of the EoS (as opposed to the familiar 2D mapping involving mass and radius, or mass and moment of inertia, Lattimer \& Prakash 2007) would be needed. Moreover, such measurements could be used together with current and future constraints form GW sources, to infer multi-messenger bounds on the stellar structure (Fasano et al. 2019).

The above mass and spin estimates are compatible with those from the early applications of the RPM, as the relevant
geodesic frequencies depend only weakly on the spin and quadrupole moment (see, e.g., Stella \& Vietri 1998, but also du Buisson et al. 2019). Instead, the EoS-independent bounds on the radius and mass that we derived represent original results of our new method. We note that the $\sim 2 M_{\odot}$ region in the NS mass-radius diagram is virtually unconstrained at present by observations in the radio and X-ray bands, while the limits on the tidal deformability from the GW170817 event, once translated into mass-radius bounds, are compatible with our


Figure 7. Ninety percent 2D credible interval and marginalized distributions of the mass and radius for the three sources analyzed. Colored curves are from of a few EoSs whose $M-R$ relation is compatible with current constraints from X-ray observations and the gravitational-wave event GW170817. The left and right edges of each colored band correspond to stellar configurations for which the spins are assumed to be zero and equal to the median of the values inferred by our MCMC analysis, respectively.
results (Abbott et al. 2018). We remark that a precise measurement of the mass quadrupole moment can be used to directly constrain the EoS, without an explicit determination of the radius (see Pappas 2012; Pappas \& Apostolatos 2014). The limits on the quadrupole that we obtained in this work are very loose due to the low number of QPOs considered (up to eight for a given source) and no stringent conclusion can be drawn. Instead, significantly tighter bounds are obtained by considering a larger number of doublets (S. E. Motta et al. 2020, in preparation).

The method we presented is amenable to further, more extensive applications which exploit different QPO data sets and/or alternative QPO models. In a forthcoming study we will fit QPO triplets, each consisting of a low-frequency QPO simultaneously with the two kHz QPOs, where the former is associated with nodal precession frequency, in addition to the azimuthal and periastron precession frequencies that were used in the present study. This is expected to yield higher precision estimates of the parameters governing the NS spacetime, since the nodal precession frequency depends quite strongly on NS spin and quadrupole moment. Our method is also applicable to other models relating QPOs to geodesic frequencies. This includes models in which QPO frequency identifications are different than those of the RPM, such as the ERMs and global disk oscillation models in their various versions (e.g., Török et al. 2012; Stuchlík \& Kološ 2016 and references therein). In all cases a key requirement is that the set of independent QPO frequencies predicted by a model and fit to the data is sufficiently large that the three parameters describing NS spacetime can be derived.

The reliability of results from our new method, like that of inferences based on QPOs in general, depend crucially on the
correctness of the association of QPO signals to geodesic frequencies. Extensive, high-sensitivity, and large signal-tonoise QPO measurements to be obtained with next generation, large area X-ray missions, such as eXTP (De Rosa et al. 2019), Athena (Barcons et al. 2015), and STROBE-X (Ray et al. 2019) will allow the detection and precise characterization of a significantly higher number of QPOs from many sources. In conjunction with detailed applications of competing models and advanced methods like our own, they may provide the key to resolving long-standing ambiguities in QPO interpretation and placing stringent constraints on NS structure and EoS.

We thank Tiziano Abdelsalhin for having carefully read this manuscript. A.M., G.P., and P.P. acknowledge financial support provided under the European Union's H2020 ERC, Starting grant agreement No. DarkGRA-757480. A.M. acknowledges partial financial support provided under the European Union's H2020 ERC Consolidator grant "Matter and strong-field gravity: New frontiers in Einstein's theory" grant agreement No. MaGRaTh-646597 during the development of this project. L.S. acknowledges financial contributions from ASI-INAF agreements 2017-14-H.O and I/037/12/0 and from "iPeska" research grant (P.I. Andrea Possenti) funded under the INAF call PRIN-SKA/CTA (resolution 70/2016). This project has received funding from the European Union's Horizon 2020 research and innovation program under the Marie SklodowskaCurie grant agreement No. 690904. S.E.M. acknowledges the Violette and Samuel Glasstone Research Fellowship program, and the Oxford Centre for Astrophysical Surveys, which is funded through generous support from the Hintze Family Charitable Foundation. The authors would like to acknowledge networking support by the COST Action CA16104 and support from the Amaldi Research Center funded by the MIUR program "Dipartimento di Eccellenza" (CUP: B81I18001170001).

## Appendix A Metric Components of Rotating Neutron Stars

In this appendix, we present the explicit form of the metric functions introduced in Section 2 for the line element given in Equation (1), which describes the spacetime around a rotating NS. We refer the reader to Pappas (2017) for further details. The components of the metric are functions of the coordinates ( $\rho, z$ ), and of the multipole moments, and are given by the following expressions:

$$
\begin{align*}
f(\rho, z)= & 1-\frac{2 M}{\sqrt{\rho^{2}+z^{2}}}+\frac{2 M^{2}}{\rho^{2}+z^{2}} \\
& +\frac{\left(M_{2}-M^{3}\right) \rho^{2}-2\left(M^{3}+M_{2}\right) z^{2}}{\left(\rho^{2}+z^{2}\right)^{5 / 2}} \\
& +\frac{2 z^{2}\left(-J^{2}+M^{4}+2 M_{2} M\right)-2 M M_{2} \rho^{2}}{\left(\rho^{2}+z^{2}\right)^{3}} \\
& +\frac{A(\rho, z)}{28\left(\rho^{2}+z^{2}\right)^{9 / 2}}+\frac{B(\rho, z)}{14\left(\rho^{2}+z^{2}\right)^{5}}  \tag{A1}\\
\omega(\rho, z)= & -\frac{2 J \rho^{2}}{\left(\rho^{2}+z^{2}\right)^{3 / 2}}-\frac{2 J M \rho^{2}}{\left(\rho^{2}+z^{2}\right)^{2}}+\frac{F(\rho, z)}{\left(\rho^{2}+z^{2}\right)^{7 / 2}} \\
& +\frac{H(\rho, z)}{2\left(\rho^{2}+z^{2}\right)^{4}}+\frac{G(\rho, z)}{4\left(\rho^{2}+z^{2}\right)^{11 / 2}}, \tag{A2}
\end{align*}
$$

$$
\begin{align*}
\zeta(\rho, z)= & \frac{\rho^{2}\left[J^{2}\left(\rho^{2}-8 z^{2}\right)+M\left(M^{3}+3 M_{2}\right)\left(\rho^{2}-4 z^{2}\right)\right]}{4\left(\rho^{2}+z^{2}\right)^{4}} \\
& -\frac{M^{2} \rho^{2}}{2\left(\rho^{2}+z^{2}\right)^{2}} \tag{A3}
\end{align*}
$$

where

$$
\begin{align*}
A(\rho, z)= & 8 \rho^{2} z^{2}\left(24 J^{2} M+17 M^{2} M_{2}+21 M_{4}\right) \\
& +\rho^{4}\left(-10 J^{2} M+7 M^{5}+32 M_{2} M^{2}-21 M_{4}\right) \\
& +8 z^{4}\left(20 J^{2} M-7 M^{5}-22 M_{2} M^{2}-7 M_{4}\right), \tag{A4}
\end{align*}
$$

$$
\begin{align*}
B(\rho, z)= & \rho^{4}\left(10 J^{2} M^{2}+10 M_{2} M^{3}+21 M_{4} M+7 M_{2}^{2}\right) \\
& +4 z^{4}\left(-40 J^{2} M^{2}-14 J S_{3}+7 M^{6}+30 M_{2} M^{3}\right. \\
& \left.+14 M_{4} M+7 M_{2}^{2}\right)-4 \rho^{2} z^{2}\left(27 J^{2} M^{2}-21 J S_{3}\right. \\
& \left.+7 M^{6}+48 M_{2} M^{3}+42 M_{4} M+7 M_{2}^{2}\right), \tag{A5}
\end{align*}
$$

$$
\begin{align*}
H(\rho, z)= & 4 \rho^{2} z^{2}\left[J\left(M_{2}-2 M^{3}\right)-3 M S_{3}\right] \\
& +\rho^{4}\left(J M_{2}+3 M S_{3}\right), \tag{A6}
\end{align*}
$$

$$
\begin{align*}
G(\rho, z)= & \rho^{2}\left\{-J^{3}\left(\rho^{4}+8 z^{4}-12 \rho^{2} z^{2}\right)\right. \\
& +J M\left[\left(M^{3}+2 M_{2}\right) \rho^{4}-8\left(3 M^{3}+2 M_{2}\right) z^{4}\right. \\
& \left.+4\left(M^{3}+10 M_{2}\right) \rho^{2} z^{2}\right] \\
& \left.+M^{2} S_{3}\left(3 \rho^{4}-40 z^{4}+12 \rho^{2} z^{2}\right)\right\}  \tag{A7}\\
F(\rho, z) & =\rho^{4}\left(S_{3}-J M^{2}\right)-4 \rho^{2} z^{2}\left(J M^{2}+S_{3}\right) \tag{A8}
\end{align*}
$$

The spacetime defined above can be given in an even more convenient form so as to have the right Schwarzschild limit when the rotation goes to zero, i.e., $j \rightarrow 0$. To this aim, we resume the expansions of $f(\rho, z)$ and $\zeta(\rho, z)$, using the variable $r=\sqrt{\rho^{2}+z^{2}}$, such that when the rotation vanishes the metric coincides with the exact Schwarzschild solution in its standard form. With this procedure, we obtain:

$$
\begin{align*}
f(\rho, z)= & 1-\frac{4 M}{r_{-}+r_{+}+2 M} \\
& +\frac{\alpha^{2} j^{4} M^{6}\left(\rho^{2}-2 z^{2}\right)^{2}}{2 r^{10}}+\frac{2 \beta j^{4} M^{6} z^{2}\left(2 z^{2}-3 \rho^{2}\right)}{r^{10}} \\
& -\frac{\gamma j^{4} M^{5}\left(3 \rho^{4}+8 z^{4}-24 \rho^{2} z^{2}\right)(r-2 M)}{4 r^{10}} \\
& -\frac{j^{2} M^{4}}{14 r^{10}}\left[2 M^{2}\left(-5 \rho^{4}+80 z^{4}+54 \rho^{2} z^{2}\right)\right. \\
& \left.-M\left(20 z^{2}-\rho^{2}\right)\left(5 \rho^{2}+4 z^{2}\right) r+28 z^{2} r^{4}\right] \\
& +\frac{\alpha j^{2} M^{3}}{7 r^{10}}\left[M^{3}\left(-5 \rho^{4}-60 z^{4}+96 \rho^{2} z^{2}\right)\right. \\
& +2 M^{2} r\left(-4 \rho^{4}+22 z^{4}-17 \rho^{2} z^{2}\right) \\
& \left.+14 M\left(\rho^{6}-2 z^{6}-3 \rho^{2} z^{4}\right)+7\left(2 z^{2}-\rho^{2}\right) r^{5}\right] \tag{A9}
\end{align*}
$$

and

$$
\begin{align*}
\zeta(\rho, z)= & \frac{1}{2} \log \left(\frac{r^{2}-M^{2}+r_{-} r_{+}}{2 r_{-} r_{+}}\right) \\
& +\frac{j^{2} M^{4} \rho^{2}\left[(1-3 \alpha) \rho^{2}+4(3 \alpha-2) z^{2}\right]}{4 r^{8}} \tag{A10}
\end{align*}
$$

where $r_{ \pm}=\sqrt{(M \pm z)^{2}+\rho^{2}}$ and we have used the definitions (2) for the moments. When $j \rightarrow 0$, from Equations (A2) it follows that $\omega \rightarrow 0$ and the functions $f$ and $\zeta$ take their Schwarzschild form. This metric, as the previous one, is accurate up to $M_{4}$ in the moments and up to order $\mathcal{O}\left(M^{6} / r^{6}\right)$ with respect to the vacuum field equations.

It is worth remarking that while the spacetime is given in Weyl-Papapetrou coordinates, which differ from the usual Schwarzschild-like or quasi-isotropic ones, the various geodesic frequencies are coordinate-independent quantities, while the relevant radii on the equatorial plane can be expressed in terms of the circumferential radius which is also a geometric and coordinate-independent quantity.

## Appendix B QPO Frequencies

In this appendix, we give the QPO frequencies and corresponding uncertainties for the three LMXB systems considered in this paper (Table B1). Frequencies are all from RXTE/PCA observations and were taken from van Doesburgh \& van der Klis (2017).

Table B1
QPO Frequencies (with Experimental Errors $\sigma^{( \pm)}$) Observed for the Three Sources Analyzed in this Paper, 4U1608-52, 4U0614+09, and 4U1728-34

| 4U1608-52 |  |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Doublet \# |  | $\nu_{\phi}$ |  | $\sigma_{\phi}^{(+)}$ | $\sigma_{\phi}^{(-)}$ | $\nu_{\text {per }}$ | $\sigma_{\text {per }}^{(+)}$ | $\sigma_{\text {per }}^{(-)}$ |
| 1 |  | 849.92 |  | 6.94 | 6.53 | 535.32 | 15.4 | 23.1 |
| 2 |  | 940.93 |  | 12.1 | 12.5 | 655.78 | 2.15 | 2.07 |
| 3 |  | 958.61 |  | 8.19 | 8.36 | 654.7 | 0.23 | 0.23 |
| 4 |  | 976.6 |  | 6.89 | 7.00 . | 674.76 | 1.26 | 1.24 |
| 5 |  | 1034.6 |  | 10.6 | 10.3 | 769.32 | 0.83 | 0.79 |
| 6 |  | 1041.1 |  | 7.04 | 7.32 | 774.82 | 0.83 | 0.81 |
| 7 |  | 1053.1 |  | 11.2 | 13.6 | 740.61 | 0.59 | 0.54 |
| 4U0614+09 |  |  |  |  |  |  |  |  |
| \# | $\nu_{\phi}$ | $\sigma_{\phi}^{(+)}$ |  | $\sigma_{\phi}^{(-)}$ |  | $\nu_{\text {per }}$ | $\sigma_{\text {per }}^{(+)}$ | $\sigma_{\text {per }}^{(-)}$ |
| 1 | 957.11 | 18.97 |  | 9 9.24 |  | 636.61 | 1.98 | 2.1 |
| 2 | 959.41 | 17.06 |  | 7.73 |  | 649.9 | 1.61 | 1.8 |
| 3 | 1076.4 |  | 11.2 |  | 14.4 | 749.84 | 1.77 | 1.68 |
| 4 | 1103.8 |  | 10.7 |  | 11.1 | 761.02 | 1.21 | 1.29 |
| 5 | 1166.7 |  | 16.9 |  | 21.7 | 753.15 | 5.67 | 5.23 |
| 4U1728-34 |  |  |  |  |  |  |  |  |
| \# | $\nu_{\phi}$ | $\sigma_{\phi}^{(+)}$ |  | $\sigma_{\phi}^{(-)}$ |  | $\nu_{\text {per }}$ | $\sigma_{\text {per }}^{(+)}$ | $\sigma_{\text {per }}^{(-)}$ |
| 1 | 717.9 | 5.09 |  | 5.04 |  | 377. | 18.6 | 15. |
| 2 | 873.25 |  | 3.36 |  | 3.3 | 538.38 | 37.4 | 37.1 |
| 3 | 972.49 |  | 5.68 |  | 5.51 | 614.15 | 3.66 | 4.2 |
| 4 | 1089.2 |  | 3.85 |  | 3.97 | 752.42 | 0.67 | 0.66 |
| 5 | 1091.4 |  | 10.6 |  | 10.8 | 740.48 | 0.84 | 0.87 |
| 6 | 1107.3 |  | 9.99 |  | 9.72 | 778.22 | 2.85 | 2.64 |
| 7 | 1118.8 |  | 7.29 |  | 7.53 | 801.78 | 10.8 | 11. |
| 8 | 1149.9 |  | 1.58 |  | 1.16 | 816.36 | 1.08 | 1.21 |

[^4]
## ORCID iDs

Andrea Maselli © https://orcid.org/0000-0001-8515-8525
George Pappas © https://orcid.org/0000-0003-3344-3759
Paolo Pani © https://orcid.org/0000-0003-4443-1761
Leonardo Gualtieri (6) https:// orcid.org/0000-0002-1097-3266
Valeria Ferrari © https:// orcid.org/0000-0002-0600-6070
Luigi Stella © https://orcid.org/0000-0002-0018-1687

## References

Abbott, B. P., Abbott, R., Abbott, T. D., et al. 2018, PhRvL, 121, 161101
Abbott, B. P., Abbott, R., Abbott, T. D., et al. 2019, PhRvX, 9, 011001
Abramowicz, M. A., \& Kluzniak, W. 2001, A\&A, 374, L19
Akmal, A., Pandharipande, V. R., \& Ravenhall, D. G. 1998, PhRvC, 58, 1804
Armitage, P. J., \& Natarajan, P. 1999, ApJ, 525, 909
Barcons, X., Nandra, K., Barret, D., et al. 2015, JPhCS, 610, 012008
Belloni, T. M., \& Stella, L. 2014, SSRv, 183, 43
De Rosa, A., Uttley, P., Gou, L., et al. 2019, SCPMA, 62, 29504
Doneva, D. D., \& Pappas, G. 2018, in The Physics and Astrophysics of Neutron Stars, Astrophysics and Space Science Library, Vol. 457, ed. L. Rezzolla et al. (Cham: Springer International Publishing), 737

Douchin, F., \& Haensel, P. 2001, A\&A, 380, 151
du Buisson, L., Motta, S., \& Fender, R. 2019, MNRAS, 486, 4485
Fasano, M., Abdelsalhin, T., Maselli, A., \& Ferrari, V. 2019, PhRvL, 123, 141101
Fodor, G., Hoenselaers, C., \& Perjés, Z. 1989, JMP, 30, 2252
Fragile, P. C., Straub, O., \& Blaes, O. 2016, MNRAS, 461, 1356
Geroch, R. P. 1970a, JMP, 11, 1955
Geroch, R. P. 1970b, JMP, 11, 2580
Gilks, W. R., Richardson, S., \& Spiegelhalter, D. J. 1996, Markov Chain Monte Carlo in Practice (London: Chapman and Hall)
Hansen, R. O. 1974, JMP, 15, 46
Hinderer, T., Rezzolla, L., \& Baiotti, L. 2018, ASSL, 457, 575
Kato, S. 2001, PASJ, 53, L37
Kato, S. 2004, PASJ, 56, 905
Kato, S. 2012a, PASJ, 64, 139
Kato, S. 2012b, PASJ, 64, 129
Kluzniak, W., \& Abramowicz, M. A. 2001, arXiv:astro-ph/0105057
Kluzniak, W., \& Abramowicz, M. A. 2002, arXiv:astro-ph/0203314
Lattimer, J. M. 2019, Univ, 5, 159
Lattimer, J. M., \& Prakash, M. 2007, PhR, 442, 109
Markovic, D., \& Lamb, F. K. 1998, arXiv:astro-ph/9801075
Maselli, A., Gualtieri, L., Pani, P., Stella, L., \& Ferrari, V. 2015a, ApJ, 801, 115
Maselli, A., Pani, P., Gualtieri, L., \& Ferrari, V. 2015b, PhRvD, 92, 083014
Miller, M. C., Lamb, F. K., \& Cook, G. B. 1998, ApJ, 509, 793
Miller, M. C., Lamb, F. K., Dittmann, A. J., et al. 2019, ApJL, 887, L24

Morsink, S. M., \& Stella, L. 1999, ApJ, 513, 827
Motta, S. E., Belloni, T. M., Stella, L., Muñoz-Darias, T., \& Fender, R. 2014a, MNRAS, 437, 2554
Motta, S. E., Munoz-Darias, T., Sanna, A., et al. 2014b, MNRAS, 439, L65
Müller, C. L., \& Sbalzarini, I. F. 2010, in IEEE Congress on Evolutionary Computation (Piscataway, NJ: IEEE), 1
Nowak, M. A., \& Wagoner, R. V. 1991, ApJ, 378, 656
Nowak, M. A., \& Wagoner, R. V. 1992, ApJ, 393, 697
Nowak, M. A., Wagoner, R. V., Begelman, M. C., \& Lehr, D. E. 1997, ApJL, 477, L91
Ozel, F., \& Freire, P. 2016, ARA\&A, 54, 401
Özel, F., Psaltis, D., Narayan, R., \& Santos Villarreal, A. 2012, ApJ, 757, 55
Papapetrou, A. 1953, AnP, 447, 309
Pappas, G. 2012, MNRAS, 422, 2581
Pappas, G. 2015, MNRAS, 454, 4066
Pappas, G. 2017, MNRAS, 466, 4381
Pappas, G., \& Apostolatos, T. A. 2013, MNRAS, 429, 3007
Pappas, G., \& Apostolatos, T. A. 2014, PhRvL, 112, 121101
Raaijmakers, G., Riley, T. E., Watts, A. L., et al. 2019, ApJL, 887, L22
Ray, P. S., Arzoumanian, Z., Ballantyne, D., et al. 2019, arXiv:1903.03035
Riley, T. E., Watts, A. L., Bogdanov, S., et al. 2019, ApJL, 887, L21
Stein, L. C., Yagi, K., \& Yunes, N. 2014, ApJ, 788, 15
Stella, L., \& Vietri, M. 1998, ApJL, 492, L59
Stella, L., \& Vietri, M. 1999, PhRvL, 82, 17
Stella, L., Vietri, M., \& Morsink, S. 1999, ApJL, 524, L63
Strohmayer, T. E., Zhang, W., Swank, J. H., et al. 1996, ApJL, 469, L9
Stuchlík, Z., \& Kološ, M. 2016, A\&A, 586, A130
Swank, J. H., Jahoda, K., Zhang, W., et al. 1995, Proc. of the NATO Advanced Study Institute on the Lives of the Neutron Stars (Dordrecht: Kluwer), 525
Syunyaev, R. A. 1973, SvA, 16, 941
Török, G., Abramowicz, M. A., Kluźniak, W., \& Stuchlík, Z. 2005, A\&A, 436, 1
Török, G., Bakala, P., Šrámková, E., et al. 2012, ApJ, 760, 138
Török, G., Goluchová, K., Urbanec, M., et al. 2016, ApJ, 833, 273
Tsang, D., \& Pappas, G. 2016, ApJL, 818, L11
Urbancova, G., Urbanec, M., Török, G., et al. 2019, ApJ, 877, 66
van der Klis, M. 1995, in IAU Coll. 151, Flares and Flashes 454, ed. J. Greiner et al. (Berlin: Springer), 321
van der Klis, M. 2006, Rapid X-ray Variability, Vol. 39 (Cambridge: Cambridge Univ. Press)
van der Klis, M., Swank, J. H., Zhang, W., et al. 1996, ApJL, 469, L1
van Doesburgh, M., \& van der Klis, M. 2017, MNRAS, 465, 3581
Wagoner, R. V., Silbergleit, A. S., \& Ortega-Rodriguez, M. 2001, ApJL, 559, L25
Watts, A. L. 2012, ARA\&A, 50, 609
Watts, A. L., Andersson, N., Chakrabarty, D., et al. 2016, RvMP, 88, 021001
Wiringa, R. B., Fiks, V., \& Fabrocini, A. 1988, PhRvC, 38, 1010
Yagi, K., Kyutoku, K., Pappas, G., Yunes, N., \& Apostolatos, T. A. 2014, PhRvD, 89, 124013
Yagi, K., \& Yunes, N. 2017, PhR, 681, 1


[^0]:    5 We note that our metric is a different, more accurate approach than the second order Hartle-Thorne spacetime, which neglects multipole moments higher than the quadrupole, and is not valid for larger rotation rates.

[^1]:    ${ }^{6}$ According to the RPM, a third frequency (historically known as horizontal branch oscillations, see van der Klis 1995) is associated with the nodal precession frequency, $\nu_{\text {nod }}=\nu_{\phi}-\nu_{\theta}$ (Stella \& Vietri 1998; Stella et al. 1999). 7 This metric is an approximate vacuum solution of Einstein's field equations, that is accurate up to $M_{4}$ in the moments and up to sixth order in $M / \sqrt{\rho^{2}+z^{2}}$.

[^2]:    8 Equations (3) and (4) are accurate up to 5\% for all state-of-the-art hadronic NS EoSs (Yagi et al. 2014; Pappas 2017). In the case of quark stars, similar relations hold with slightly different values of the coefficients.

[^3]:    9 Following Abbott et al. (2019) for parameters bounded by the prior, as the quadrupole, we quote the $90 \%$ one-sided upper limit, while for all the other parameters we quote the $90 \%$ highest-posterior density interval.

[^4]:    Note. According the RPM, $\left(\nu_{\phi}, \nu_{\text {per }}\right)$ correspond to the kHz QPO doublets.

