### I. INTRODUCTION

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The life of massive stars  $(8M_{\odot} - 100M_{\odot})$  ends with the collapse of their iron core under their own gravity, leading the formation of a neutron star or a black hole (BH), followed (typically but not necessarily in the BH case) by the explosion of the star as a supernova. Core-collapse supernova (CCSN) explosions are one most important sources of gravitational-waves (GW) that have not yet been detected by current ground-based observatories. This is because even the most common type of CCSN, the neutrino-driven explosion, have a rate about three per century [1] within our galaxy. The other main type of explosion, those produced by the magneto-rotational mechanism, can produce a more powerful signal and can be detected at distances up to  $\sim 5$  Mpc [1]. However, the rate of events of this kind is much lower than the one for the neutrino driven mechanism  $\sim 10^{-4} {\rm yr}^{-1}$ , which represents less than 1% of all CCSNe. Despite all this, collapsing stars produces a complex GW signal which could <sup>74</sup> provide significant clues about the physical processes that occur in the moments after the explosion.

In the past years an impressive progress has been made 75 in the development of numerical codes, which allows to 76 obtain more accurate CCSN simulations. The waveforms produced by the magneto-rotational mechanism in particular is well understood. The core-bounce signal can 78 be directly related with the rotational properties of the 79 core [2–4]. However, the low rate of this kind of events 80 and is low amplitude and high frequency of the bounce 81 signal in the slow-rotation case will probably impede its 82 detection.

In the case of most common neutrino-driven mecha- 84 nism, the GW emission is manly produced during the 85 hydrodynamical bounce and the unstable evolution of 86 the fluid inside the region formed by the recently formed 87 proto-neutron star (PNS) and the accretion shock. The 88 dynamics excite the different modes of oscillation of the 89 PNS [5, 6]. Unluckily, in this case is not possible to re- 90 late the GW emission with the properties (mass, rota-91 tion rate, metallicity or magnetic fields) of the progeni- 92 tor stars. There are many reasons that explain this is-93 sue. The large number of physical processes involved 94 whose role in the escenario is not completely understood. 95 For instance, exist uncertainties in the stellar evolution 96 of massive stars or in the nuclear and weak interactions 97 necessary for the equation of state (EoS) or the neutrino 98 interactions. Furthermore, the stochastic and chaotic na- 99 ture of the instabilities is transferred to the GW emission, 100 resulting in the same progenitor leading to a significantly 101 different waveform. These large number of physical in- $_{102}$ gredients in addition to the necessary accuracy of the 103 modelling of complex multidimensional interactions re-104 quires large computational resources. One simulation of 105 one single progenitor in 3D with accurate neutrino transport and realistic equation of state (EoS) can take several months of intense calculations on a scientific supercomputer facility, which complicates the systematic exploration of the progenitor parameters.

Common features in the GW signal, that have been interpreted as g modes of the PNS, have been reported in many works [7–12]. Typically, the frequencies associated with the modes rise monotonically with time during the contraction of the PNS. The characteristic frequencies of the modes associated to the PNS make them promising candidates for detection in ground-based interferometers.

Introduce the topic of the paper: method to extract from the GW data the Mass and the radius of the PNS as function of time using the universal relations.

Previous work in identifying modes from spectrogram

Paper organization

# II. CORE COLLAPSE SUPERNOVA SIMULATIONS

Martin's simulations and code description 1D similation data to fit the ratio vs frequency model - AA and CoConut outputs

We apply our analysis to a set of 25 spherically symmetric [21] and 7 two-dimensional axisymmetric models of stellar core collapse simulated with two codes, Co-CoNuT (one-dimensional models) and AENUS-ALCAR [13] (one- and two-dimensional models). CoCoNuT [14] is a code for general relativistic hydrodynamics coupled to the Fast Multigroup Transport scheme [15] providing an approximate description of the emission and transport of neutrinos. AENUS-ALCAR [13] combines special relativistic (magneto-)hydrodynamics, a modified Newtonian gravitational potential approximating the effects of general relativity [16], and a spectral twomoment neutrino transport solver [13]. We included the relevant reactions between matter and neutrinos of all flavours, i.e., emission and absorption by nucleons and nuclei, electron-positron pair annihilation, nucleonic bremsstrahlung, and scattering off nucleons, nuclei, and

Our spherically symmetric simulations cover the range of initial stellar masses  $M_{\rm ZAMS} = 11.2-75\,M_{\odot}$ . They were carried out using six equations of state (EOSs). They are complemented by a set of two-dimensional axisymmetric models consisting of stellar core collapse of five stars with zero-age main-sequence masses of  $M_{\rm ZAMS} = 11.2-40\,M_{\odot}$  evolved through the hydrostatic phases by [17]. We performed one simulation of each

Simulation	$M_{ m ZAMS}[M_{\odot}]$	EOS	$t_{ m f}[ m s]$	explosion	$M_{\rm PNS}[M_{\odot}]$	142
s11	11.2	LS220	1.86	×	1.47	
s15	15.0	LS220	1.66	×	2.00	
s15S	15.0	SFHo	1.75	×	2.02	
s15G	15.0	$\operatorname{GShen}$	0.97	×	1.86	143
s20	20.0	LS220	1.53	×	1.75	144
s25	25.0	LS220	1.60	0.91	2.33	145
s40	40.0	LS220	1.70	1.52	2.23	_

TABLE I. List of axisymmetric simulations. We present the name of the models, the initial mass of the progenitors, and the EOS used, and the final post-bounce time of the simula-147 tions. For models which explode, we list the time at which the shock starts to expand in column "explosion"; otherwise, a  $\times$  sign is displayed. The final column indicates the mass of the PNS at the end of the simulation.

stellar model using the equation of state of [18] with an incompressibility of  $K=220\,\mathrm{MeV}$  and added comparison models with the SFHo EOS [19] and the EOS of [20] for the one with  $M_{\mathrm{ZAMS}}=15\,M_{\odot}$  (see Table I for a list of models).

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We mapped the pre-collapse state of the stars to a spherical coordinate system with  $n_r = 400$  zones in radial direction distributed logarithmically with a minimum grid width of  $(\Delta r)_{\min} = 400$  m and an outer radius of  $r_{\max} = 8.3 \times 10^9$  cm and  $n_{\theta} = 128$  equidistant cells in angular direction. For the neutrino energies, we used a logarithmic grid with  $n_e = 10$  bins up to 240 MeV.

All spherical and most axisymmetric models fail to achieve shock revival during the time of our simulations. Only the two stars with the highest masses, s25 and s40, develop relatively late explosions in axisymmetry. Consequently, mass accretion onto the PNSs proceeds at high rates for a long time in all cases and causes them to oscillate with their characteristic frequencies. The final masses of the PNSs are in the range of  $M_{\rm PNS}=1.47-2.33\,M_{\odot}$ , i.e., insufficient for producing a black hole.

### III. METHODS DESCRIPTION

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In this section, we outline a strategy for estimating <sup>168</sup> the time evolution of the ratio  $r = M_{\rm PNS}/R_{\rm PNS}^2$  of the <sup>169</sup> mass of the PNS and its squared radius (in units of solar <sup>170</sup> mass and km) from the observation of the <sup>2</sup> $g_2$  oscillation <sup>171</sup> mode in the gravitational wave detector data. An integral <sup>172</sup> part of this strategy is the universal relations that relate <sup>173</sup> the characteristic frequency of the PNS oscillation f,  $g_{174}$  and p modes with the mass and the radius of the PNS, <sup>175</sup> the shock radius and the total mass inside the shock as <sup>176</sup> demonstrated in [21].

Using 25 1D simulations obtained with the AENUS-178 ALCAR code [] and the CoCoNuT [] code, we179 parametrize the ratio with a cubic polynomial regression180

with heteroscedastic errors

$$r_i = \beta_1 f_i + \beta_2 f_i^2 + \beta_3 f_i^3 + \epsilon_i \tag{1}$$

where  $\epsilon_i$  are assumed to be independent zero-mean Gaussian errors with variances  $\sigma_i^2$  that increase with frequency  $f_i$ . The model for frequency-dependent variances is

$$\log \sigma_i = \alpha_0 + \alpha_1 f_i + \alpha_2 f_i^2 + \delta_i \tag{2}$$

with independent and identically zero-mean Gaussian errors  $\delta_i$ . The R-package LMVAR [22] that implements a maximum likelihood approach was used to fit the model. The best fitting model amongst polynomials of degree 1, 2, and 3 was chosen according to the Aikaike information criterion with coefficients given in Table II,

$$r_i = \beta_1 f_i + \beta_3 f_i^3 + \epsilon_i \tag{3}$$

The best-fitting model achieves a coefficient of determination of  $R^2=0.9812$ . The data and fit of the model including 95% confidence bands are displayed in Figure 1

Coefficient	Estimate	standard error
$\beta_1$	$6.09 \times 10^{-7}$	$1.75 \times 10^{-8}$
$\beta_3$	$6.24\times10^{-13}$	$8.79 \times 10^{-15}$

TABLE II. Estimate and standard error of the coefficients of the best fit model describing the ratio  $r = M_{\rm PNS}/R_{\rm PNS}^2$  as function of the frequency of the  $^2g_2$  mode.

To develop the method we considered the gravitational wave signal s20-gw-10kpc described in Section II, originally sampled at 16384 Hz but resampled at 4096 Hz. A spectrogram of this signal is shown in Figure 2 based on autoregressive estimates of the local spectra for successive time intervals of length 200 with a 90% overlap. The dominant emission mode corresponds to the  ${}^{2}g_{2}$ -mode. We have developed a time-frequency method to track the ridge m(t) in the spectrogram, taking into account that it is monotonically increasing as time goes, a property of the  ${}^{2}g_{2}$ -mode. Starting from either the left- or rightmost column of the time-frequency matrix we identify and trace the sequence of amplitude peaks within a certain frequency band given the monotonicity constraint. Appendix A is providing more details on the reconstruction of the q mode ridge.

We collect the instantaneous frequency  $f(t_i)$  corresponding to the ridge  $m(t_i)$  for the midpoint  $t_i$  of each local time interval of the spectrogram and interpolating f(t) for values in between the  $t_i$ . We then use equation (3) to obtain estimates of the time evolution of the ratio together with 95% confidence intervals. An exemple is given in Figure 3 where the red points are the point estimates and the grey bands represent 95% confidence bands. The black points are the ratio values computed

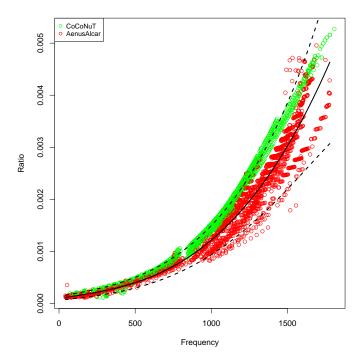


FIG. 1. Ratio  $M_{\rm PNS}/R_{\rm PNS}^2$  from 25 1D simulations AENUS-ALCAR (red) and CoCoNuT (green) code. The solid line is the maximum likelihood estimate of heteroscedastic cubic model with 95% confidence bands (dashed lines) considering the AENUS-ALCAR data points.

using the mass and radius values obtained from the simulation code.

In this case, for a GW signal without any noise, the coverage of our 95% confidence band is 94%. In the next section we explore how accurately we can estimate r(t) when the gravitational wave signal is embedded in noise.

# IV. DETECTION SENSITIVITY WITH ADVANCED GRAVITATIONAL WAVE DETECTORS

To estimate how accurately we can infer the time evolution of  $r = M_{\rm PNS}/R_{\rm PNS}^2$  in the gravitational wave detector data, we have added \$20-gw-10kpc GW signal to Gaussian noise realisations whose power spectral density follows advanced LIGO spectrum [23]. We have varied the distances to the source, covering a large range of distances for which a detection in second generation of gravitational wave detectors is feasible. The source is optimally oriented with respect to the gravitational wave207 detector. We are assuming a GW signal from a core208 collapse phenomena has been identified in the data and209 that the beginning of the GW signal is known. The data210 (signal embedded in noise) are whitened using the func-211 tion prewhiten of the R-package TSA. An auto-regressive212 model with maximal 100 coefficients has been used.

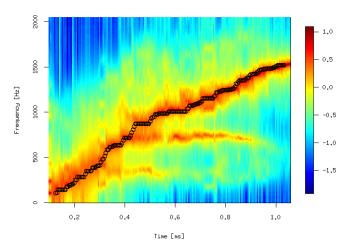


FIG. 2. Spectrogram of the gravitational wave signal s20-gw-10kpc sampled at 4096 Hz. The spectrogram is obtained using data streach of 200 samples overlapping at 90% with each other.

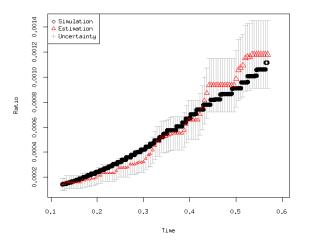


FIG. 3. Ratio  $M_{\rm PNS}/R_{\rm PNS}^2$  as function of time extracted from the  $^2g_2$ -mode of the s20-gw-10kpc signal (red points and the 95% confidence belt in grey) compared to the ratio value derived from the PNS mass and radius given by the simulation code (black points).

For each of the noise realisations, we reconstruct the ratio time series  $r_i$  of length N and compute two quantities that compare  $r_i$  to ratio  $r_i^0$  derived from the PNS mass and radius generated by the simulation code that produces s20-gw-10kpc. measure the estimation accuracy. The first quantity is the coverage probability (covpbb) which is the fraction of the ratio  $r_i^0$  values that fall within the 95% confidence interval of  $r_i$ . We also compute the

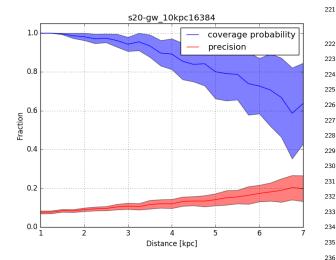


FIG. 4. covpbb and precision for s20-gw-10kpc signal embed- $^{237}$  ded in aLIGO noise at different distance from the Earth. The  $^{238}$  shaded regions are given by the median absolute deviation.  $^{239}$ 

precision value given by

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$$precision = \sum_{1}^{N} \frac{|r_i - r_i^0|}{r_i^0}$$
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Figure 4 is showing the median of covpbb and  $precision_{250}^{249}$  as function of the distance of the source as well as the confidence belt corresponding to the median absolute deviation.

## V. DISCUSSION

Acknowledgments —

## Appendix A G-MODE RECONSTRUCTION

Given the spectrogram and an specified time interval for the g-mode reconstruction, our proposal method works as follows. The starting point must be specified. It can be either at the beginning or at the end of the signal. Then, in one of these extremes, the maximum energy value is identified, registering its frequency. This is done independently for a number of consecutive time intervals. Then we calculate the median of these frequency values, providing a robust starting value for the g-mode reconstruction.

The starting frequency value is the first g-mode estimate for the first or the last time interval, depending on the specified starting location. If the reconstruction is set to start at the beginning of the signal, the reconstruction will be done progressively over the time intervals, where each maximum frequency value will be calculated within a frequency range specified by the previous g-mode estimate. Given the non-decreasing behaviour of the true g-mode values, the g-mode estimates will be forced to be greater or equal than the one estimated for its previous time interval, and lower than a specified upper limit. As a result, the g-modes estimates will be a non-decreasing sequence of frequency values.

If the reconstruction is set to start at the end of the signal, the g-modes will be estimated backward in time. Each maximum frequency is calculated within a range determined by its successor (in time) g-mode estimate. These estimates are forced to be lower or equal than its successor (in time) estimate, but greater than a specified lower limit. Thus, a non-decreasing sequence of g-mode estimates is guaranteed.

This g-mode reconstruction method works if and only if the signal is strong enough to provide information about the g-mode, which is reflected in the spectrogram.

Given the sequence of g-mode estimates, the confidence band will be calculated by using the model defined in (3). The g-mode estimates are frequency values which we use as predictors in the model in order to generate confidence intervals for the ratios. Since the g-mode estimates are indexed by time, the confidence intervals for the ratios are too. Thus, we generate the confidence band by interpolating the lower and upper limits of the collection of consecutive confidence intervals, which will be valid for the time range of the g-mode estimates. This confidence band is used to estimate the coverage probabilities in our simulation studies presented below.

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