Fourier transform of the continuous gravitational wave signal

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The direct detection of continuous gravitational waves from pulsars is a much anticipated discovery in the emerging field of multimessenger gravitational wave (GW) astronomy. Because putative pulsar signals are exceedingly weak large amounts of data need to be integrated to achieve desired sensitivity. Contemporary searches use ingenious *ad hoc* methods to reduce computational complexity. In this paper we provide analytical expressions for the Fourier transform of realistic pulsar signals. This provides description of the manifold of pulsar signals in the Fourier domain, used by many search methods. We analyze the shape of the Fourier transform and provide explicit formulas for location and size of peaks resulting from stationary frequencies. We apply our formulas to analysis of recently identified outlier at 1891.76 Hz.

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I. INTRODUCTION

Continuous gravitational waves are an eagerly anticipated but elusive phenomena [1]. Despite a series of searches since early 2000 (in particular [2–8]) there have been no loud detections. Some recent papers have seen signals with moderately high SNR, but it is not known yet whether they are due to the instrumental noise or astrophysical signals.

Continuous gravitational waves are expected from rapidly rotating neutron stars, as well as from more exotic sources [9–14].

In this paper we study the Fourier transform of the continuous wave signal using analytical techniques.

Published by the American Physical Society under the terms of the Creative Commons Attribution 4.0 International license. Further distribution of this work must maintain attribution to the author(s) and the published article's title, journal citation, and DOI. Open access publication funded by the Max Planck Society. This study was motivated by loosely coherent algorithms [15–17] which adapt to the shape of the signal manifold.

The Fourier transform of continuous wave signal is analogous to the time-domain representation of a binary waveform. Understanding it is essential for interpreting detection candidates.

The Fourier transform can be computed numerically by first generating gravitational wave signal. Present day gravitational wave detectors produce data at 16384 Hz sample rate, so a 3-day signal takes ≈33 GB of memory to store. One can reduce storage requirements by heterodyning, but that still results in cumbersome memory and computing requirements.

Our analytical results yield a simple method for determining location and strengths of peaks in the Fourier transform of a continuous wave signal, without the need to generate the entire waveform. This has immediate applications for understanding the influence of detector artifacts.

Currently available gravitational wave data has frequency spectrum contaminated with numerous sharp peaks [2,6]. The question of overlap of astrophysical signals with these artifacts can be partitioned into direct and inverse problems:

(i) In a direct problem, we know the signal parameters with some tolerance and we would like to find out

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which instrumental lines are located in the signal spectrum.

(ii) In the inverse problem, we want to know which signals have spectrum covering a known line.

We provide explicit formulas describing location and strength of the peaks in the Fourier transform. These formulas can then be used to efficiently solve both direct and inverse problems of correspondence between signals and sharp detector artifacts. We developed an algorithm for peak computation, detailed in Fig. 4.

II. SIGNAL MODEL

A pure monochromatic signal has linear phase evolution. While this would be computationally simple to search for, the search would be challenging due to confusion of putative signals with numerous instrumental lines [6].

Realistic gravitational wave signals have multiple sources of modulation, due to Doppler shifts from detector motion relative to the source, possible source motion due to nearby astrophysical bodies, or intrinsic evolution of the source, such as slow decrease in frequency due to energy loss.

All such signals are nearly monochromatic and can be described by the equation

$$h(t) = \Re(a(t)e^{i\phi(t)}) \tag{1}$$

The Fourier transform of h(t) is thus a convolution of the Fourier transform of amplitude modulation and the phase modulation terms. The amplitude modulation a(t) varies slowly, and its Fourier transform has only five terms: a constant offset, and harmonics (sinusoidal terms) corresponding to periods of half and full sidereal day. Thus most of the complexity is in the behavior of the phase modulation term.

To simplify exposition we assume that a(t) is unity everywhere the signal is defined and focus on the phase modulation terms alone. We do study the case when input data has gaps, which act as a much stronger amplitude modulation of the waveform.

Such gaps occur naturally due to lock losses in interferometer operations. They can also arise effectively in data that would normally be deweighted due to high noise, or due to unfavorable interferometer angle to the incoming linearly polarized signal.

The phase modulation $\phi(t)$ is a powerful tool in separating astrophysical signals from detector artifacts, but its complicated form and dependence on many parameters, such as source and detector locations and frequency drift parameters presents a computational challenge.

It is instructive to consider a simplified situation of a fixed frequency source and a detector following two superimposed circular motions—one around Earth's axis and one of Earth around the Sun.

First, we compute relative detector position to Earth center:

$$\vec{r}_{\text{Earth}} = \begin{pmatrix} \cos(\omega_{\text{rot}}t + \alpha_0)\cos(\delta_0) \\ \sin(\omega_{\text{rot}}t + \alpha_0)\cos(\delta_0) \\ \sin(\delta_0) \end{pmatrix} R_{\text{Earth}}$$
 (2)

where α_0 and δ_0 are the detector longitude and latitude locations correspondingly.

The full motion of the detector is then described as

$$\vec{r}_{\text{det}} = \vec{r}_{\text{Earth}} + \vec{v}\cos(\omega_{\text{orb}}t) + \vec{u}\sin(\omega_{\text{orb}}t)$$
 (3)

where \vec{u} and \vec{v} are two perpendicular vectors in the ecliptic plane parametrizing Earth's orbital motion.

This can be generalized as

$$\vec{r}_{\text{det}} = \vec{r}_{\text{off}} + \sum_{k=1}^{K} \vec{v}_k \cos(\omega_k t) + \vec{u}_k \sin(\omega_k t)$$
 (4)

Here $\vec{r}_{\rm off}$ is a constant offset, which for circular approximation is $R_{\rm Earth} \sin(\delta_0) \hat{\vec{z}}$. Since the offset is constant, it only affects absolute signal phase. For simplicity we will assume $\vec{r}_{\rm off} = 0$ in subsequent calculations.

Our simplified example with two modulations arising from circular motions corresponds to K=2. The Eq. (4) is general enough that one can fit any realistic signal by including additional harmonics, for example, due to planetary perturbations. The algorithm presented in Fig. 4 is run using solar system barycenter timings incorporating full complexity of the underlying signal.

The direction to the source is given by

$$\hat{n}_{\text{source}} = \begin{pmatrix} \cos(\alpha)\cos(\delta)\\ \sin(\alpha)\cos(\delta)\\ \sin(\delta) \end{pmatrix}. \tag{5}$$

Here α is the right ascension in radians $[0, 2\pi)$ and δ is the declination in radians $[-\pi/2, \pi/2]$.

The detector velocity vector is

$$\vec{v}_{\text{det}} = \frac{d}{dt}\vec{r}_{\text{det}} = \sum_{k=1}^{K} \vec{u}_k \omega_k \cos(\omega_k t) - \vec{v}_k \omega_k \sin(\omega_k t).$$
 (6)

The Doppler shift is computed from the formula:

$$\mathcal{D} = \frac{\hat{n}_{\text{source}} \cdot \vec{v}_{\text{det}}}{c}$$

$$= \sum_{k} \frac{\hat{n}_{\text{source}} \cdot \vec{u}_{k}}{c} \omega_{k} \cos(\omega_{k} t) - \frac{\hat{n}_{\text{source}} \cdot \vec{v}_{k}}{c} \omega_{k} \sin(\omega_{k} t).$$
(7)

We introduce relative modulation depth a_k^{rel} and modulation phase ϕ_k :

$$a_k^{\text{rel}} = \frac{\omega_k}{c} \sqrt{(\hat{n}_{\text{source}} \cdot \vec{u}_k)^2 + (\hat{n}_{\text{source}} \cdot \vec{v}_k)^2}$$
(8)

$$\phi_k = \arctan\left(\frac{\hat{n}_{\text{source}} \cdot \vec{u}_k}{\hat{n}_{\text{source}} \cdot \vec{v}_k}\right). \tag{9}$$

Then the Doppler shift becomes:

$$\mathcal{D} = \sum_{k=1}^{K} a_k^{\text{rel}} \cos(\omega_k t + \phi_k). \tag{10}$$

Let us widen the model for our source signal to include polynomial frequency evolution, which is observed in radio pulsars:

$$f(t) = \sum_{n=0}^{N} f_n \frac{t^n}{n!}$$
 (11)

The signal received at the detector is then

$$f(t) = \left(\sum_{n=0}^{N} f_n \frac{t^n}{n!}\right) \left(1 + \sum_{k=1}^{K} a_k^{\text{rel}} \cos(\omega_k t + \phi_k)\right). \tag{12}$$

This ignores relativistic corrections.

Let us assume that the products $f_n a_k^{\rm rel}$ are negligible for all $n \ge 1$. This is the case for frequency drifts in most known radio pulsars. For example, with $f_1 \approx 10^{-12}$ Hz/s and with Doppler shifts from Earth orbital motion $a_2^{\rm rel} \approx 10^{-4}$ we find the product $f_1 a_2^{\rm rel} \approx 10^{-16}$ Hz/s much smaller than resolution of most all-sky searches. Then the signal model simplifies to:

$$f(t) = \sum_{n=0}^{N} f_n \frac{t^n}{n!} + f_0 \sum_{k=1}^{K} a_k^{\text{rel}} \cos(\omega_k t + \phi_k). \quad (13)$$

We now introduce phase modulation depth a_k as

$$a_k = \frac{2\pi f_0 a_k^{\text{rel}}}{\omega_k} = \frac{2\pi f_0}{c} \sqrt{(\hat{n}_{\text{source}} \cdot \vec{u}_k)^2 + (\hat{n}_{\text{source}} \cdot \vec{v}_k)^2}.$$
(14)

Then the phase model of our signal is

$$\phi(t) = \phi_0 + 2\pi \sum_{n=1}^{N} f_{n-1} \frac{t^n}{n!} + \sum_{k=1}^{K} a_k \sin(\omega_k t + \phi_k). \quad (15)$$

Here ϕ_0 controls the initial phase of the signal.

To make sense of modulation amplitudes and phases, we focus on our initial case of two circular modulations.

The vectors u_1 and v_1 describing Earth's rotation are

$$\vec{v}_1 = R_{\text{Earth}} \begin{pmatrix} \cos \alpha_0 \cos \delta_0 \\ \sin \alpha_0 \cos \delta_0 \\ 0 \end{pmatrix} \tag{16}$$

$$\vec{u}_1 = R_{\text{Earth}} \begin{pmatrix} -\sin \alpha_0 \cos \delta_0 \\ \cos \alpha_0 \cos \delta_0 \\ 0 \end{pmatrix}$$
 (17)

where α_0 and δ_0 are detector longitude and latitude correspondingly.

Then the parameters corresponding to Earth's rotation are

$$\phi_{1} = \arctan\left(\frac{\hat{n}_{\text{source}} \cdot \vec{u}_{k}}{\hat{n}_{\text{source}} \cdot \vec{v}_{k}}\right)$$

$$= \arctan\left(\frac{\sin(\alpha - \alpha_{0})\cos(\delta_{0})}{\cos(\alpha - \alpha_{0})\cos(\delta_{0})}\right) = \alpha - \alpha_{0} \quad (18)$$

$$a_1 = \frac{2\pi f_0 R_{\text{Earth}}}{c} |\cos(\delta) \cos(\delta_0)| \tag{19}$$

We see that modulation phase ϕ_1 is just the difference between source right ascension and detector longitude.

The vectors u_2 and v_2 describing Earth orbital motion are

$$\vec{v}_2 = R_{\text{orb}} \begin{pmatrix} 1 \\ 0 \\ 0 \end{pmatrix} \tag{20}$$

$$\vec{u}_2 = R_{\text{orb}} \begin{pmatrix} 0 \\ \cos \epsilon \\ \sin \epsilon \end{pmatrix} \tag{21}$$

where $\epsilon = 23.4^{\circ}$ is the obliquity of the ecliptic.

The parameters corresponding to Earth orbital motion around the Sun are somewhat more complicated:

$$\phi_2 = \arctan\left(\frac{\sin(\alpha)\cos(\delta)\cos(\epsilon) + \sin(\delta)\sin(\epsilon)}{\cos(\alpha)\cos(\delta)}\right)$$

$$a_2 = \frac{2\pi f_0 R_{\text{orb}}}{\epsilon}$$
(22)

$$\frac{c}{\sqrt{\cos^2(\alpha)\cos^2(\delta) + (\sin(\alpha)\cos(\delta)\cos(\epsilon) + \sin(\delta)\sin(\epsilon))^2}}$$
(23)

This complexity is due to the choice of equatorial coordinate system. Had we chosen ecliptic coordinates instead the orbital motion parameters would be simple, while the Earth rotation parameters have similar expressions to the above, as we will essentially exchange indices. As we will see later the shorter period motion introduces more

complexity in the Fourier transform, so it makes sense to use the equatorial coordinate system in applications.

III. FOURIER TRANSFORM OF QUASIMONOCHROMATIC SIGNAL

A. Signal spectrum

In the general case the signal spectrum is

$$\tilde{h}_{0}(f) = \int_{-T/2}^{T/2} \exp(i\phi(t))e^{-i2\pi f t} dt$$

$$= \int_{-T/2}^{T/2} \exp\left\{i\phi_{0} + 2\pi i \sum_{n=2}^{N} f_{n-1} \frac{t^{n}}{n!} + i \sum_{k=1}^{K} a_{k} \sin(\omega_{k} t + \phi_{k})\right\} \cdot e^{-i2\pi(f - f_{0})t} dt \qquad (24)$$

Thus the spectrum depends on initial signal phase ϕ_0 , initial frequency f_0 , higher order frequency expansion parameters f_k (for $k \ge 1$), phase modulation depth a_k and modulation phase ϕ_k .

For searches less than 30 days the effect of third order and higher frequency derivatives can be neglected for astrophysical sources. Keeping terms up to a second order in frequency, the equation simplifies to

$$\tilde{h}_{0}(f) = \int_{-T/2}^{T/2} \exp\left\{i\phi_{0} + i2\pi\left(f_{1}\frac{t^{2}}{2} + f_{2}\frac{t^{3}}{6}\right) + i\sum_{k=1}^{K} a_{k}\sin(\omega_{k}t + \phi_{k})\right\} \cdot e^{-i2\pi(f - f_{0})t}dt.$$
 (25)

The treatment of sinusoidal phase modulation can use either the Jacobi-Anger expansion in terms of Bessel functions or approximation of the sine function by polynomials.

B. Polynomial approximation

The polynomial approximation is particularly effective when $\omega_l T$ is small.

For example:

$$a_k \sin(\omega_k t + \phi_k) = a_k \left(\omega_k t - \frac{\omega_k^3 t^3}{6} + O(\omega_k^5 t^5) \right) \cos(\phi_k)$$
$$+ a_k \left(1 - \frac{\omega_k^2 t^2}{2} + O(\omega_k^4 t^4) \right) \sin(\phi_k).$$
(26)

Table I shows modulation parameters for sources emitting at various example frequencies.

For example, in the case of T=3 days we find that the Earth's orbital motion is a good candidate for polynomial expansion and would need terms up to a cubic order.

Indeed, the error in Eq. (26) can be bounded by the 4th order term:

$$a_l \frac{\omega_l^4 T^4}{4!2^4} \le 0.11 \tag{27}$$

Here we assumed the expansion is centered on the middle of the interval so the maximum time is T/2.

Let L_E be the set of indices describing expanded harmonics. Consider the following integral by neglecting constant phase term:

$$\tilde{h}_{0}(f) = \int_{-T/2}^{T/2} \exp\left(2\pi i g_{1} \frac{t^{2}}{2} + 2\pi i g_{2} \frac{t^{3}}{6} + i \sum_{k \notin L_{E}} a_{k} \sin(\omega_{k} t + \phi_{k})\right) \cdot e^{-i2\pi(f - g_{0})t} dt \quad (28)$$

where coefficients g_n have been introduced that describe both initial polynomial frequency modulation parameters and the contribution from polynomial expansion of sinusoidal modulations:

TABLE I. Modulation parameters.

Modulation term	Source frequency	Earth rotation	Orbital motion	Unit
ω_l		6.3	0.017	(1/day)
a_l	200 Hz	23	630000	
a_l	1000 Hz	115	3200000	
a_l	2000 Hz	230	6300000	
$a_l\omega_l$	200 Hz	0.0017	0.123	Hz
$a_l\omega_l$	1000 Hz	0.0084	0.63	Hz
$a_l\omega_l$	2000 Hz	0.017	1.23	Hz
$a_l \omega_l^2$	200 Hz	1.2×10^{-7}	2.4×10^{-8}	Hz^2
$a_l \omega_l^2$	1000 Hz	6.1×10^{-7}	1.2×10^{-7}	Hz^2
$a_l\omega_l^2$	2000 Hz	1.2×10^{-6}	2.4×10^{-7}	Hz^2

Modulation parameters for various sources. The amplitude modulation values are worst case, as seen in LIGO Livingston interferometer. Phase and frequency modulation are dominated by orbital motion, while the frequency derivatives are larger for terms from Earth rotation.

$$g_n = f_n + \sum_{k \in L_E} \frac{a_k \omega_k^{n+1}}{2\pi(n+1)!} \cos\left(\phi_k + \frac{\pi n}{2}\right).$$
 (29)

This model of polynomial plus harmonics is very effective in describing a realistic pulsar signal. As we will show later, the phase behavior of exact Solar System barycenter timings can be approximated with a single harmonic plus a third order polynomial over any data stretch of 3 days or less.

C. Jacobi-Anger expansion

We now focus on the application of the Jacobi-Anger expansion. Applying it to all sinusoidal terms we get:

$$\tilde{h}_{0}(f) = \int_{-T/2}^{T/2} \exp\left(2\pi i g_{1} \frac{t^{2}}{2} + 2\pi i g_{2} \frac{t^{3}}{6} - i 2\pi (f - g_{0})t\right)$$

$$\cdot \exp\left(i \sum_{l \notin L_{E}} a_{l} \sin(\omega_{l} t + \phi_{l})\right) dt$$

$$= \int_{-T/2}^{T/2} \exp\left(2\pi i g_{1} \frac{t^{2}}{2} + 2\pi i g_{2} \frac{t^{3}}{6} - i 2\pi (f - g_{0})t\right)$$

$$\cdot \prod_{l \notin L_{E}} \sum_{k_{l}} i^{k_{l}} J_{k_{l}}(a_{l}) \exp(i k_{l}(\omega_{l} t + \phi_{l})) dt. \tag{30}$$

The product and sum symbols can be exchanged yielding a sum over multi-indices $\vec{k} = (k_1, ..., k_M)$:

$$\tilde{h}_{0}(f) = \int_{-T/2}^{T/2} \exp\left(2\pi i g_{1} \frac{t^{2}}{2} + 2\pi i g_{2} \frac{t^{3}}{6} - i 2\pi (f - g_{0})t\right) \cdot \sum_{\vec{k}} \prod_{l \notin L_{E}} i^{k_{l}} J_{k_{l}}(a_{l}) \exp(i k_{l} (\omega_{l} t + \phi_{l})) dt.$$
(31)

The indices \vec{k} span an infinite lattice for exact expression. However, the values $J_{k_l}(a_l)$ decrease rapidly for $k_l \gg |a_l|$, allowing a finite sum to be used in practical calculations.

The number of remaining indices in a sum depends on modulation depth a_l and can be fairly substantial even for relatively small modulation values. This complexity is intrinsic to the problem, as can be confirmed by examining numerically computed Fourier transform in Fig. 2—the multitude of peaks would need separate harmonic terms to produce them.

Mathematically, this can be understood as follows.

First we perform the expansion of longer period harmonics as done in Eq. (28) keeping only one remaining harmonic. Then we split the integral into pieces of length matching one period T_p (where $T_p\omega_1=2\pi$). We assume the full integration interval is the integer multiple of period T_p :

$$\tilde{h}_{0}(f) = \sum_{m=0}^{M} \int_{-T_{p}/2+mT_{p}}^{T_{p}/2+mT_{p}} \cdot \exp\left(2\pi i g_{1} \frac{t^{2}}{2} + 2\pi i g_{2} \frac{t^{3}}{6} + i a_{1} \sin(\omega_{1}t + \phi_{1})\right) \cdot e^{-2\pi i (f-g_{0})t} dt.$$
(32)

Shifting the internal integration variable by mT_p we obtain:

$$\tilde{h}_{0}(f) = \sum_{m=0}^{M} \int_{-T_{p}/2}^{T_{p}/2} \exp\left(2\pi i g_{1} \frac{(t+mT_{p})^{2}}{2} + 2\pi i g_{2} \frac{(t+mT_{p})^{3}}{6} + i a_{1} \sin(\omega_{1}t + \phi_{1})\right)$$

$$\cdot e^{-2\pi i (f-g_{0})(t+mT_{p})} dt. \tag{33}$$

The argument of the sine function is unmodified because we shift by integral number of periods.

The Taylor formula provides a convenient way to compute a shift of any analytic function:

$$p(t+T) = \sum_{n=0}^{\infty} \frac{T^n}{n!} \frac{d^n}{dt^n} p(t).$$
 (34)

For polynomials the sum is finite because higher order derivatives vanish. Our polynomial is only third order:

$$p(t) = 2\pi(g_0 - f)t + 2\pi g_1 \frac{t^2}{2} + 2\pi g_2 \frac{t^3}{6}.$$
 (35)

Leading to a simple expression for the shift:

$$p(t + mT_p) = p(t) + mT_p 2\pi \left(g_0 - f + g_1 t + g_2 \frac{t^2}{2}\right) + \frac{m^2 T_p^2}{2} 2\pi (g_1 + g_2 t) + \frac{m^3 T_p^3}{6} 2\pi g_2.$$
 (36)

Thus the shifted integral can be described as a convolution of a single-period Fourier transform with a Fourier transform of $\exp(i(p(t+mT_p)-p(t)))$. The latter can be separated into three parts:

(i) a multiplication by the phase

$$\exp\left(2\pi i \left(\frac{g_1 m^2 T_p^2}{2} + \frac{g_2 m^3 T_p^3}{6}\right)\right) \tag{37}$$

- (ii) a shift in frequency by $g_1mT + g_2m^2T_p^2/2$ which we denote by operator S(m).
- (iii) and a convolution with Fourier transform of a Gaussian $\exp(\pi i T_p g_2 t^2)$ iterated m times. We denote a single iteration of the convolution by operator \mathbb{T} . Then the full integral can be expressed as

$$\tilde{h}_0(f) = \sum_{m=0}^{M} e^{2\pi i (\frac{g_1 m^2 T_p^2}{2} + \frac{g_2 m^3 T_p^3}{6})} \mathbb{T}^m \mathbb{S}(m) \tilde{h}_0^1(f)$$
 (38)

where $\tilde{h}_0^1(f)$ denotes a single period Fourier transform:

$$\tilde{h}_{0}^{1}(f) = \int_{-T_{p}/2}^{T_{p}/2} \exp\left(2\pi i g_{1} \frac{t^{2}}{2} + 2\pi i g_{2} \frac{t^{3}}{6} + i a_{1} \sin(\omega_{1} t + \phi_{1})\right) e^{-i2\pi(f - g_{0})t} dt$$
(39)

This expression explains features of the Fig. 2. The repeated pattern is due to iterations of the operator \mathbb{T} and frequency shift $\mathbb{S}(m)$. However, both this operator and the frequency shift \mathbb{S} introduce frequency shifts that are not aligned to frequency bins of the full Fourier transform. Thus the height of peaks varies with each iteration.

The variation in phase together with convolution acts to scramble the heights of smaller peaks resulting in a signature of the underlying signal.

IV. FOURIER TRANSFORM SHAPE

The Eq. (38) allows us to understand the Fourier transform of continuous wave signals in a qualitative way. For practical applications it is desirable to know the details such as location of the peaks and their heights.

While this can be done by the numerical integration of formula (38), the computation is comparable in difficulty to taking the Fourier transform directly. What we would like instead is a simple formula depending on parameters of the signal g_k , ω_1 and ϕ_1 .

To obtain such formulas, consider the integral

$$\tilde{h}_{0}(f) = \int_{-T/2}^{T/2} \exp\left(2\pi i g_{1} \frac{t^{2}}{2} + 2\pi i g_{2} \frac{t^{3}}{6} + i \sum_{l \notin L_{E}} a_{l} \sin(\omega_{l} t + \phi_{l})\right) e^{-2\pi i (f - g_{0})t} dt$$

$$= \int_{-T/2}^{T/2} \exp(i\Lambda(t)) dt. \tag{40}$$

Because of the imaginary terms in the exponent it is highly oscillatory. These oscillations will cancel out (on average), except in points where derivative of $\Lambda(t)$ vanishes:

$$\Lambda'(t) = 2\pi g_1 t + 2\pi g_2 \frac{t^2}{2} + \sum_{l \notin L_E} a_l \omega_l \cos(\omega_l t + \phi_l) - 2\pi (f - g_0). \tag{41}$$

This can be rewritten as

$$F(t) = g_0 + g_1 t + g_2 \frac{t^2}{2} + \sum_{l \notin L_E} \frac{a_l \omega_l}{2\pi} \cos(\omega_l t + \phi_l) = f.$$
(42)

Because f is a free parameter, the support of the spectrum of our signal is close to the image of the interval [-T/2, T/2] under a function F(t) (Fig. 2).

The largest peaks in the spectrum should correspond to the values of f for which larger time intervals have stationary phase, and thus to the points $f_a = F(t_a)$ such that the derivative of F vanishes:

$$F'(t_a) = g_1 + g_2 t_a - \sum_{l \notin L_E} \frac{a_l \omega_l^2}{2\pi} \sin(\omega_l t_a + \phi_l) = 0$$
 (43)

This equation has an approximate solution in the special case of a single sinusoidal term and small parameters g_1 and g_2 .

In this case the equation reduces to

$$\sin(\omega_1 t_a + \phi_1) = \frac{2\pi g_1}{a_1 \omega_1^2} + \frac{2\pi g_2}{a_1 \omega_1^2} t_a \tag{44}$$

Let $t_a^0 = \frac{-\phi_1 + \pi n}{\omega_1}$ be the zero of the sine function.

Applying one step of Newton-Raphson method to find the solution of the above equation using t_a^0 as the initial value, we have

$$t_a = t_a^0 - \frac{g_1 + g_2 t_a^0}{g_2 - (-1)^n \frac{a_1 \omega_1^3}{2\pi}}$$
 (45)

Let us check how close we got to true zero of F'(t). We substitute t_a into Eq. (43):

$$F'(t_a) = g_1 + g_2 t_a - \frac{a_l \omega_1^2}{2\pi} \sin(\omega_1 t_a + \phi_l)$$

$$\approx a_1 \omega_1^2 O\left(\left(-\omega_1 \frac{g_1 + g_2 t_a^0}{g_2 - (-1)^n \frac{a_1 \omega_1^3}{2\pi}}\right)^3\right). \quad (46)$$

We see the approximate solution t_a has canceled all linear terms.

To find out the frequencies of the peaks we can now substitute t_a into the Eq. (42). We find

$$f \approx F(t_a) \approx g_0 + g_1 t_a + g_2 \frac{t_a^2}{2} + (-1)^n \frac{a_1 \omega_1}{2\pi} \left(1 - \frac{1}{2} \left(\frac{\omega_1 (g_1 + g_2 t_a^0)}{g_2 - (-1)^n \frac{a_1 \omega_1^3}{2\pi}} \right)^2 \right). \tag{47}$$

The zeros of the second frequency derivative are simpler to find:

$$F''(t_a) = g_2 - \sum_{l \neq l, n} \frac{a_l \omega_l^3}{2\pi} \cos(\omega_l t_b + \phi_l) = 0. \quad (48)$$

In the case of a single sinusoidal term we have:

$$\frac{a_1 \omega_1^3}{2\pi} \cos(\omega_1 t_b + \phi_1) = g_2 \tag{49}$$

$$t_b = \frac{\arccos(\frac{2\pi g_2}{a_1 \omega_1^3}) - \phi_1 + \pi n}{\omega_1}$$
 (50)

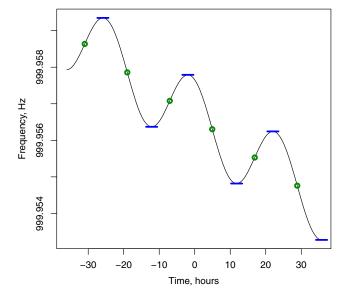


FIG. 1. Example 3-day frequency evolution of 1000 Hz monochromatic signal from source at right ascension 0° and declination 0°. The blue lines mark locations of local frequency minima and maxima. Green circles mark location of inflection points. The frequencies were computed for LIGO Hanford interferometer. The 3-day segment started at GPS 1160657033.

For the common case of $|2\pi g_2| \ll |a_1\omega_1^3|$ the formula simplifies to

$$t_b = -\phi_1 + \pi n \tag{51}$$

To test these formulas we generated barycentered time series for LIGO Hanford and Livingston interferometers [18] for multiple sky locations over one year period.

Figure 1 shows locations of local frequency maxima and minima, as well as inflection points where the second frequency derivative vanishes for a portion of this data for a 3-day period starting at GPS time 1160657033 generated for LIGO Hanford interferometer.

Figure 2 shows power spectrum (absolute value squared of the Fourier transform) of a pure 1000 Hz signal with amplitude 1 as observed by LIGO Hanford interferometer. Unlike real data sets which have gaps due to interferometer lock loss this time series is contiguous.

We observe that the spectrum support (marked by the thick green line below the graph) is correctly computed by formula (42).

The peak locations marked by short blue lines at the top of the graph were computed with formula (47) and correspond well with numerical results.

Having found peak locations we would like to have a measure of their heights, as those clearly vary.

Near a point of stationary frequency the Fourier transform has the form

$$h_{\text{local}}(f) = \int_{t_0}^{t_1} e^{2\pi i(\phi + F(t_a)(t - t_a) + \tilde{g}_2(t - t_a)^3/6)} e^{-2\pi i f t} dt \qquad (52)$$

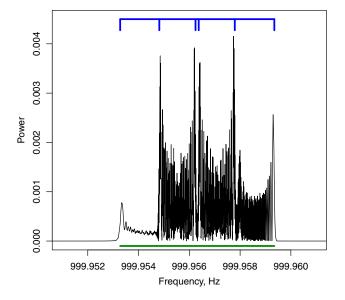


FIG. 2. Example 3-day Fourier transform of 1000 Hz monochromatic signal from source at right ascension 0° and declination 0°. The green line at the bottom of the plot shows spectrum support region estimated using Eq. (42). The blue line at the top shows peak locations estimated using Eq. (47). The Fourier transform was computed assuming 100% duty cycle for LIGO Hanford interferometer. The 3-day segment started at GPS 1160657033.

where we introduced \tilde{g}_2 :

$$\tilde{g}_2 = g_2 - \frac{a_1}{2\pi} \frac{\cos(\omega_1 t_a + \phi_1)}{6}.$$
 (53)

This equation is designed to describe the vicinity of $f = F(t_a)$. The limits of the integration t_0 and t_1 bound the region where the approximation holds, in particular there is no need to integrate over points close to other stationary frequency points.

The height of the peak is given by

$$|h_{\text{local}}(F(t_a))| = \left| \int_{t_0}^{t_1} e^{2\pi i \tilde{g}_2(t - t_a)^3 / 6} dt \right|. \tag{54}$$

We now need to find out which values of t_0 and t_1 to use. Naively we might expect that one should use a small interval where the frequency does not change far away from stationary value $F(t_a)$.

However, this will grossly underestimate peak height. The reason is that the value of truncated Airy function [Eq. (54)] keeps growing with increasing time interval, as nearby frequencies contribute due to spectral leakage.

A good heuristic is to choose t_0 and t_1 to be the inflection points, or a data boundary if it occurs earlier.

The truncated Airy function has an expression in terms of incomplete Gamma function:

$$\int_{t_0}^{t_1} e^{it^3} dt = \frac{1}{3\sqrt[3]{-i}} \left(\Gamma\left(\frac{1}{3}, -it_0^3\right) - \Gamma\left(\frac{1}{3}, -it_1^3\right) \right)$$
 (55)

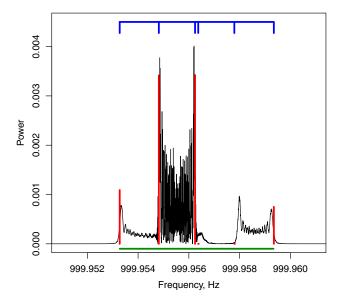


FIG. 3. Example 3-day Fourier transform of 1000 Hz monochromatic signal from source at right ascension 0° and declination 0°. The green line at the bottom of the plot shows spectrum support region estimated using Eq. (42). The blue line at the top shows peak locations estimated using Eq. (47). The red lines show peak strength estimated using Eq. (59). The Fourier transform was computed assuming the data stretch had a 30 hour gap in data for LIGO Hanford interferometer. The 3-day segment started at GPS 1160657033. The gap started 10 hours later.

This equation has some ambiguity as to the branch of cubic roots. This arises purely from using the incomplete Γ function:

$$\Gamma(a,z) = \Gamma(a) \left(1 - z^a e^{-z} \sum_{k=0}^{\infty} \frac{z^k}{\Gamma(a+k+1)} \right)$$
 (56)

The constant terms in the formula above subtract when substituted in Eq. (55).

This can also be seen by expanding e^{it^3} into a Taylor series and integrating the result:

$$\int_{t_0}^{t_1} e^{it^3} dt = \sum_{k=0}^{\infty} \frac{i^k t_1^{3k+1}}{k!(3k+1)} - \sum_{k=0}^{\infty} \frac{i^k t_0^{3k+1}}{k!(3k+1)}$$
 (57)

However, for practical application it is convenient to approximate with a heuristic piecewise linear function that captures the general shape of the integral.

To do this, we introduce the function

$$H(a) = \begin{cases} |a| & \text{when } |a| < 0.4\\ 0.4 & \text{when } |a| \ge 0.4 \end{cases}$$
 (58)

Then

$$|h_{\text{local}}(F(t_a))| = \left| \int_{t_0}^{t_1} e^{2\pi i \tilde{g}_2(t - t_a)^3 / 6} dt \right|$$

$$\approx \frac{1}{\kappa} |H(t_1 \kappa) - (-1)^{\text{sgn}(t_0) \text{sgn}(t_1)} H(t_0 \kappa)| \quad (59)$$

where
$$\kappa = \sqrt[3]{6/\tilde{g}_2}$$
.

This simple formula works surprisingly well. An illustration is given in Fig. 3. Here we marked both peak locations and their strength. Also for this example we introduced a gap of 30 hours, demonstrating the ability to handle noncontiguous data.

V. SPECTRUM SHAPE ALGORITHM

The analysis detailed in the previous section can be condensed into the algorithm for determining Fourier transform spectral shape (Table IV).

At the start of the algorithm we compute a sequence of times relative to Solar System barycenter. This could be done exactly, or as an approximation. For example, one can compute these times for a relatively coarse grid on the sky and then use a suitable method, such as [19] to interpolate between locations.

Once this time series has been obtained it can be fitted to the formula

$$t_{i} = \sum_{n=1}^{N} g_{n} s_{i}^{n} + A \cos(\omega_{1} s_{i} + \phi_{1})$$
 (60)

over an interval matching the coherence length of the Fourier transform. Long stretches of data are best analyzed using overlapped intervals. A straightforward speedup is to interpolate the fits from those computed on a coarse grid.

Also, iteration over signal waveforms with the same sky location but with different frequency drift is achieved by direct modifications of coefficients q_k .

- 1. The input to the algorithm is a series of timestamps $\{s_i\}_{i=1}^{\tilde{N}}$ in the local interferometer frame, as well as the computed times $\{t_i\}_{i=1}^{\tilde{N}}$ in solar system barycenter frame.
- 2. Compute the fit $t_i = \sum_{n=1}^N g_n s_i^n + A \cos(\omega_1 s_i + \phi_1)$. N can be taken as 3 for time intervals shorter than 3 days. ω_1 is the rotational frequency correspondingly to Earth sidereal period.
- 3. Compute times of zero frequency derivative and their corresponding stationary frequencies (see equations 45 and 47). These give peak locations.
- 4. Compute times of zero second frequency derivative (inflection points, equations 50 and 51).
- 5. Estimate peak amplitudes with formula 59, where t_0 and t_1 are nearest inflection points or data boundaries.
- 6. The output of the algorithm consists of estimated peak frequencies and amplitudes

FIG. 4. Algorithm used to compute the shape of Fourier transform.

With the fit in hand, it is straightforward to find locations of stationary points t_a and inflection points t_b [Eqs. (45), (50), and (51)].

Now the frequencies of the peaks are given by formula (47) and peak height is computed using formula (59).

The computed spectrum shape can be used to understand the dwell time of signal waveform and used to characterize and mitigate the influence of detector artifacts—either after analysis by removing outliers coincident with detector lines, or during the analysis by decreasing weight of segments with larger peak heights.

VI. PERFORMANCE

The formulas (47), (54), and (59) are very efficient compared to computing Fourier transform from scratch or to numerically integrating Eq. (38).

For the direct problem of determining peak locations and amplitudes, any method would need to compute time-stamps first. The computing cost of the Fourier transform is similar or larger to the cost of computing timestamps—such algorithms have theoretically steeper scaling of $C\tilde{N}\log(\tilde{N})$ of computational effort compared to number of \tilde{N} of input data points. In practice the running time of the Fourier transform is strongly influenced by implementation efficiency or, in other words, constant C. A general purpose library algorithm will not be as efficient as hand-tuned implementation for fixed input size.

Our algorithm replaces the Fourier transform with a fit of computed timestamps, that is easy to optimize taking advantage of vector arithmetic. Moreover, for large parameter searches we would need to perform this computation repeatedly for a range of signal parameters, in particular frequency and frequency derivative. In such a situation, computing Fourier transform over and over again is very expensive. Our algorithm computes peak timings with a simple formula, and can be used to translate signal parameter range into the range of peak locations and amplitude.

The inverse problem of determining signal parameters that correspond to a known instrumental line is even harder to solve with brute force Fourier transform, as it will require to sample a large grid to check for coincidence of computed peaks with the line. As expected an analytic formula is much faster.

The efficiency of the algorithm is contingent on the validity of the underlying model. To test how well this model fits the data we made a study using numerically computed timings.

A coarse sky grid of 182 points was used for this study. The points on the grid were arranged in 18° increments in declination and right ascension. Only one value of right ascension was used for equatorial poles with declination of $\pm 90^{\circ}$.

For each point in the sky grid we generated 17520 Solar System barycenter timings using routines from LAL library [20]. The timing started at GPS 1160657033 with 0.5 hour

increments. Separate datasets were generated for LIGO Hanford and Livingston interferometers.

Using this dataset we tested fit to the single harmonic model:

$$t' = \sum_{n=0}^{N} g_n \frac{t^n}{n!} + A \sin(\omega_s t + \phi_1)$$
 (61)

where t is the time in the detector frame of reference, t' is the time at Solar system barycenter and ω_s is the angular frequency corresponding to Earth sidereal rotation period. All other coefficients were fitted.

For each point in the sky the entire set of timestamps was separated in 3-day stretches, with nearby stretches overlapped by 1.5 days. Each stretch was fitted using at most cubic terms N=3. The absolute worst residual maximized over all stretches and all sky points was 13.2 μ s.

A similar procedure was performed for 6-day stretches, this time increasing the number of polynomial terms to N=4 and using a 3-day overlap. The absolute worst residual was 24.7 μ s.

As the typical signals studied in continuous gravitational wave searches go up to 2 kHz the precision of the fit is sufficient to apply results described in this paper.

VII. APPLICATION TO ANALYSIS OF OUTLIER AT 1891.76 Hz

The outlier at 1891.75674 Hz identified in recent search [21] is an excellent target to illustrate application of our

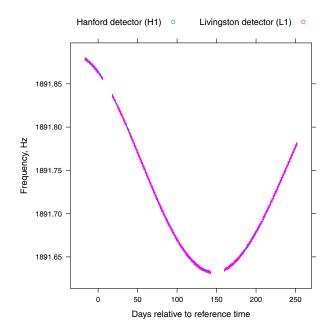


FIG. 5. Apparent frequency of a signal with parameters equal to those of the outlier at 1891.76 Hz, at the detectors. The difference in Doppler shifts between interferometers is small compared to the Doppler shifts from the Earth's orbital motion. The reference time is at GPS epoch 1183375935.

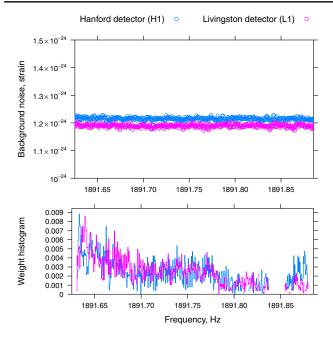


FIG. 6. The top plot shows the average amplitude spectral density around the frequency of the outlier at 1891.76 Hz. The bottom plot shows how much the power in each frequency bin would contribute, over the course of the O2 run, to the total power estimated by the Falcon pipeline for a signal with the parameters of the outlier at ≈ 1891.8 Hz. High-weight values correspond to bins with greater contribution and the sum of all the weights is 1 for each curve. The gap corresponds to a break in the O2 run and matches the gap in the frequency evolution plot (Fig. 5).

method. If it is of astrophysical origin it would likely correspond to the fastest rotating neutron star found to date. This outlier had a frequency drift of -8.22×10^{-12} Hz/s and rather wide frequency evolution as illustrated in Figs. 5 and 6 (reproduced from [21]).

As shown on Fig. 1 the outlier spanned almost 0.25 Hz because of large Doppler shifts due to orbital motion.

Because the O2 science run spanned 9.5 months there is a region with stationary frequency. For this outlier it happens to overlap a gap in data taking.

Figure 6 shows interferometer spectrum in the top panel. It was generated without applying any outlier specific corrections such as Doppler shifts or amplitude modulation, but using the same noise-weighting scheme. The individual points correspond to individual bins in 1800 s long Hannwindowed Fourier transforms of the underlying data. This is a rather coarse resolution compared to the 6-day long coherence length used in the last stage of outlier followup in [21]. However, the plot does show an absence of large detector artifacts—such as narrow lines that occur at other frequencies.

In order to better understand this outlier it is desirable to figure out whether some coherent detector noise is being masked by shot noise background. To do this we examine the locations of stationary peaks of our outlier. As it has arisen from a search over wide parameter space, the presence of instrumental noise source should force those peaks to cluster so as to raise the signal-to-noise ratio of the outlier.

Figure 7 shows how peak frequencies change with outlier frequency drift for LLO detector at LIGO Livingston observatory. Having analytic formulas was essential to producing this plot, as otherwise we would need to iterate over individual frequency drift values—a procedure that is difficult to do even on a large cluster because of large demands on storage bandwidth of existing software.

We observe a fairly even distribution of peak on Fig. 7, except for gaps due to gaps in O2 science run and a dense area on the left corresponding to outlier frequency minimum.

A magnified view of peak near outlier frequency minimum is shown on Fig. 8. We used different colors to separate individual peak lines. We observe that as

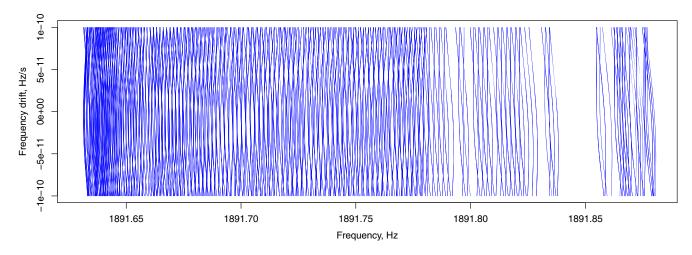


FIG. 7. Dependence of stationary peak frequency on frequency drift for outlier at 1891.76 Hz using data corresponding to LIGO Livingston Observatory (LLO). The dense area on the left of the plot corresponds to the frequency minimum seen in Fig. 5.

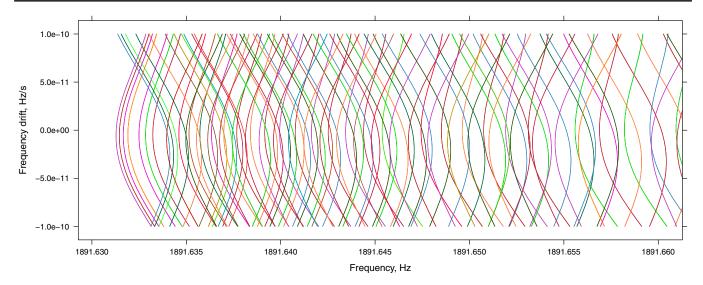


FIG. 8. Dependence of stationary peak frequency on frequency drift for outlier at 1891.76 Hz. We show a magnified view of lower band of outlier frequency evolution. Different colors identify individual peaks.

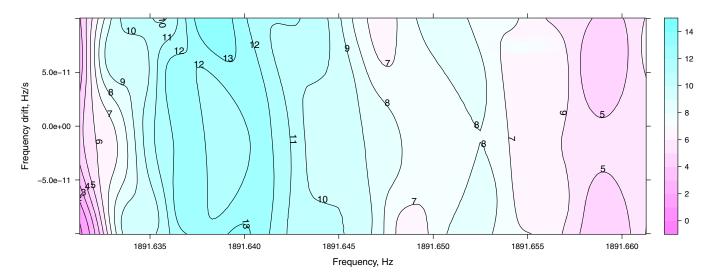


FIG. 9. Density of stationary peaks for outlier at 1891.76 Hz. We show a magnified view of low-frequency band. The density was computed using the Gaussian kernel with bandwidth of 1 mHz.

frequency drift varies most peaks move in the same direction, with small variations between individual peaks. There is no single area where many peaks cross that would allow a sharp instrumental line to have undue influence.

However, it could be that there is a wider hidden instrumental line and the outlier takes advantage of that by increasing peak density where the line is. To study this we made plots of peak density, one of which—a magnified view of low frequency band—is shown in Fig. 9. We observe that there is nothing special about the frequency drift corresponding to the outlier at 1891.76 Hz, and, in fact, there are nearby areas of larger frequency drift and larger peak density.

Similar plots for LHO detector at LIGO Hanford observatory are similar, except for showing smaller peak

density. Our conclusion from these studies is that it is highly unlikely that the outlier at 1891.76 Hz was caused by a stationary detector artifact.

VIII. CONCLUSIONS

The question of identification of continuous wave outliers to detector disturbances is of utmost importance in separating astrophysical signals from detector artifacts.

In this paper we analyze the shape of the Fourier transform of continuous wave gravitational wave signal and present simple formulas to compute peak heights and locations arising from features in frequency evolution of gravitational wave signal.

While our focus was on understanding Fourier transform of a gravitational wave signal, the formulas and the analysis presented here can be applied to any signals of this form.

We apply our formulas to investigate the outlier at 1891.76 Hz [21] and find that this outlier is unlikely to be induced by a stationary detector artifact.

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