

Gravitational wave memory of the binary black hole events in GWTC-2Zhi-Chao Zhao,¹ Xiaolin Liu,¹ Zhoujian Cao^{1,2,*} and Xiaokai He³¹*Department of Astronomy, Beijing Normal University, Beijing 100875, China*²*School of Mathematics and Computational Science, Hunan First Normal University, Changsha 410205, China*³*School of Fundamental Physics and Mathematical Sciences, Hangzhou Institute for Advanced Study, UCAS, Hangzhou 310024, China*

(Received 11 January 2021; accepted 23 August 2021; published 29 September 2021)

Gravitational wave (GW) memory is an important prediction of general relativity. Existing works on the GW memory detection targeted the nonoscillatory strain. It is hard for the wave strain analysis method to detect the GW memory due to its quasidirect current behavior and weakness. We implement a completely different scheme in this work to estimate the GW memory. In this scheme, we first apply the Bondi-Metzner-Sachs method to calculate the GW memory of a binary black hole based on numerical relativity simulation. Then we construct a surrogate model to relate a binary black hole's parameters and the GW memory. Afterwards we apply this surrogate model together with Bayesian techniques to estimate the GW memory of the 48 binary black hole events recorded in GWTC-2. The GW memory corresponding to all 48 events has been estimated.

DOI: [10.1103/PhysRevD.104.064056](https://doi.org/10.1103/PhysRevD.104.064056)**I. INTRODUCTION**

The memory of gravitational wave (GW) was first found by Zeldovich, Braginsky, Thorne and their co-workers [1–4]. This kind of GW memory is produced by the change of a quadrupole moment for slowly moving sources. Christodoulou found that gravitational wave itself can also produce memory [5,6]. This kind of memory is usually called nonlinear memory. The GW memory detection [7–9] may be used to study the gravitational theory [10] and spacetime dimension [11]. Several works in the past years [12–20] have investigated the possibility of detecting the nonlinear memory. All of the works focused on trying to extract memory from its direct effect on the interferometer data, rather than inferring it indirectly from the source parameters. Because the GW memory behaves mainly as a quasidirect current signal, the detector responds to it weakly. Such fact makes direct detection of GW memory hard.

In this paper, we implement an alternative method to investigate the GW memory of the binary black hole merger events recorded by LIGO and VIRGO. First, we design a Bondi-Metzner-Sachs method to calculate the GW memory based on numerical relativity simulation of binary black holes. Then we apply this method to the SXS catalog [21] and construct a database of binary black hole intrinsic

parameters and the corresponding GW memory due to the gravitational radiation. Based on such a database we use Gaussian process regression to construct a surrogate model describing the relationship between the binary black hole's parameters and the gravitational wave memory. Afterwards we apply such surrogate model together with Bayesian techniques to infer the GW memory of the 48 binary black hole (BBH) events in GWTC-2. We can well estimate the GW memory of these BBH events.

Our work is similar but different from that of [22]. The authors of Ref. [22] only studied the spherical harmonic mode h_{20} while we investigate the projection of the GW memory onto the detector. Mode h_{20} only depends on GW source's intrinsic parameters while the projection depends also on extrinsic parameters. Such projection corresponds to GW strain for usual GW detection.

In the next section we describe the Bondi-Metzner-Sachs (BMS) method of GW memory calculation used in the current work [23]. Then we combine the BMS method and numerical relativity simulations to construct a surrogate model of GW memory for BBHs. After that we apply our surrogate model to GW memory estimation of the binary black hole events in GWTC-2 of LIGO. Finally we give a summary and a discussion.

II. METHOD OF GRAVITATIONAL WAVE MEMORY CALCULATION

The Newman-Penrose components of Weyl tensor $\Psi_\mu, \mu = 0, \dots, 4$ admit the following relation in the wave zone [24–26]:

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$$\dot{\Psi}_2 = \delta\Psi_3 + \sigma\Psi_4, \quad \Psi_3 = -\delta\dot{\sigma}, \quad \Psi_4 = -\ddot{\sigma}. \quad (1)$$

Here σ corresponds to the shear of the (θ, ϕ) coordinate sphere in the Bondi-Sachs coordinate [27–29]. The overbar means complex conjugate. The δ operator is related to the sphere geometry. The overdot means the time derivative. The shear σ is related to the gravitational wave strain through

$$\sigma = \frac{D}{2}(h_+ + ih_\times), \quad (2)$$

where D is the luminosity distance between the observer and the source, h_+ and h_\times correspond to the two polarization modes of the gravitational wave. The relations (1) result in

$$\frac{\partial}{\partial t}(\Psi_2 + \bar{\sigma}\dot{\sigma}) = |\dot{\sigma}|^2 - \delta^2\dot{\sigma} + \bar{\sigma}\ddot{\sigma} - \sigma\ddot{\sigma}. \quad (3)$$

We can use spin-weighted -2 spherical harmonic functions to decompose the gravitational wave strain $h \equiv h_+ - ih_\times$ as follows [30–32]:

$$h(t, \theta, \phi) \equiv \sum_{l=2}^{\infty} \sum_{m=-l}^l h_{lm}(t) Y_{-2lm}(\theta, \phi), \quad (4)$$

where Y_{slm} means spin-weighted s spherical harmonic function. Plugging the above decomposition into Eq. (3) we get

$$\begin{aligned} h_{lm}|_{-\infty}^{+\infty} = & -\sqrt{\frac{(l-2)!}{(l+2)!}} \left[\frac{4}{D} \int \Psi_2 Y_{0l0} \sin\theta d\theta d\phi \right]_{-\infty}^{+\infty} \\ & - D \sum_{l'=2}^{\infty} \sum_{l''=2}^{\infty} \sum_{m'=-l'}^{l'} \sum_{m''=-l''}^{l''} \Gamma_{l'l''lm'-m''0} \\ & \times \left(\int_{-\infty}^{+\infty} \dot{h}_{l'm'} \dot{\bar{h}}_{l''m''} dt - \dot{h}_{l'm'} \bar{h}_{l''m''} \Big|_{-\infty}^{+\infty} \right). \end{aligned} \quad (5)$$

$$\begin{aligned} \Gamma_{l'l''lm'-m''-m} \\ \equiv \int Y_{-2l'm'} \bar{Y}_{-2l''m''} \cdot \bar{Y}_{0lm} \sin\theta d\theta d\phi. \end{aligned} \quad (6)$$

Here and afterwards we use $|_{-\infty}^{+\infty}$ to denote the difference between $t = \infty$ and $t = -\infty$. Now we decompose $h_{lm} = h_{lm}^{\text{osc}} + h_{lm}^{\text{mem}}$, where h_{lm}^{osc} is the oscillation part which means $h_{lm}^{\text{osc}}(-\infty) = h_{lm}^{\text{osc}}(+\infty) = 0$ and h_{lm}^{mem} is the memory part which means $\dot{h}_{lm}^{\text{mem}} \approx 0$ due to the quasidirect current behavior of the GW memory [33]. Then Eq. (5) becomes

$$\begin{aligned} h_{lm}^{\text{mem}}|_{-\infty}^{+\infty} = & -\sqrt{\frac{(l-2)!}{(l+2)!}} \left[\frac{4}{D} \int \Psi_2 Y_{0l0} \sin\theta d\theta d\phi \right]_{-\infty}^{+\infty} \\ & - D \sum_{l'=2}^{\infty} \sum_{l''=2}^{\infty} \sum_{m'=-l'}^{l'} \sum_{m''=-l''}^{l''} \Gamma_{l'l''lm'-m''0} \\ & \times \int_{-\infty}^{+\infty} \dot{h}_{l'm'}^{\text{osc}} \dot{\bar{h}}_{l''m''}^{\text{osc}} dt. \end{aligned} \quad (7)$$

If we take the mass center frame of the BBH system at the past infinity time as the inertial frame, we have $\Psi_2(-\infty, \theta, \phi) = M$. Here M corresponds to the BBH's initial total mass (Bondi mass) [34]. At the future infinity time, the BBH's total mass $M' = M - E_{\text{GW}}$ measured in the above inertial frame is smaller than the initial value M because the gravitational wave carries away some energy E_{GW} . The spacetime will settle down to a Kerr black hole with mass \tilde{M} at the future infinity time. But importantly the mass center frame at the future infinity time is different from the above inertial frame corresponding to the mass center frame at the past infinity time due to the kick velocity. These two inertial frames corresponding to the mass center frame at past infinity time and the mass center frame at the future infinity time are related by a boost transformation described by the kick velocity. Consequently $\tilde{M} = M'/\gamma$, where γ is the Lorentz factor. So corresponding to Eq. (5) we have [34]

$$\begin{aligned} \Psi_2(+\infty, \theta, \phi) = & -\frac{\tilde{M}}{\gamma^3} (1 - v_x \sin\theta \cos\phi \\ & - v_y \sin\theta \sin\phi - v_z \cos\theta)^{-3}, \end{aligned} \quad (8)$$

$$\gamma = \frac{1}{\sqrt{1-v^2}}, \quad (9)$$

where v_x , v_y and v_z are the Cartesian components of the kick velocity v .

Since the gravitational wave energy E_{GW} , the kick velocity and the oscillation part h_{lm}^{osc} have already been accurately obtained by numerical relativity simulation [35], we can plug them into Eq. (7) to calculate the gravitational memory $h_{lm}^{\text{mem}}|_{-\infty}^{+\infty}$. In Ref. [23] we investigated the waveform of GW memory. Differently here we care about the overall GW memory of BBH coalescence.

In Fig. 1 we compare our calculation results:

$$h_{lm}^i \equiv \frac{D}{M} h_{lm}^{\text{mem}} \Big|_{-\infty}^{+\infty} \quad (10)$$

for spin aligned equal mass BBH systems based on SXS simulations to the numerical relativity results by direct calculation in [36]. In the above equation, the upper index “i” means the overall GW memory corresponding to the difference between $t = +\infty$ and $t = -\infty$. In addition the recent memory calculation results by the SXS group [35]

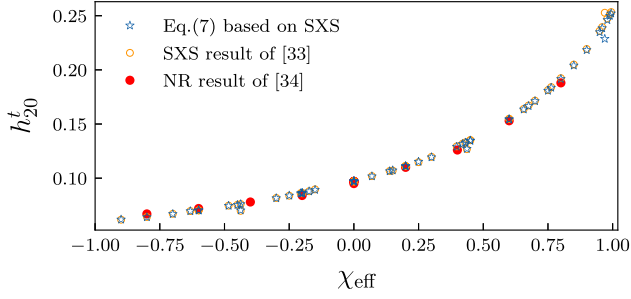


FIG. 1. GW memory h_{20}^t of spin aligned equal mass BBH respect to the effective spin. The NR result of GW memory is borrowed from Table 1 of [36].

are also shown in the figure for comparison. Following the convention of [36] we use the effective spin $\chi_{\text{eff}} \equiv \frac{m_1 \vec{\chi}_1 \cdot \hat{N} + m_2 \vec{\chi}_2 \cdot \hat{N}}{m_1 + m_2}$ as the horizontal axis, where \hat{N} is the direction of the orbital angular momentum and $\vec{\chi}_{1,2}$ denotes the dimensionless spin of the two black holes with masses $m_{1,2}$. The perfect consistency indicates the reliability of our method for GW memory calculation. For these spin aligned BBHs, we confirm previous approximation that $h_{lm}^{\text{mem}} \approx 0$, $m \neq 0$ and $h_{l0}^{\text{osc}} \approx 0$. For precession BBHs, our results obtained through the Bondi-Metzner-Sachs method are also consistent to that of SXS results [35] like Fig. 1.

III. SURROGATE MODEL OF GRAVITATIONAL WAVE MEMORY FOR BBH

The effect of GW memory of BBH merger on the interferometry detector can be well described by [37]

$$h^{\text{mem}} = \frac{M}{D} \Re \left[(F^+(\theta, \phi, \psi) + iF^\times(\theta, \phi, \psi)) \times \sum_{l=2}^{\infty} \sum_{m=-l}^l h_{lm}^t Y_{-2lm}(\iota, \beta) \right] \approx \frac{M}{D} F^+(\theta, \phi, \psi) h_{20}^t Y_{-220}(\iota), \quad (11)$$

$$F^+(\theta, \phi, \psi) \equiv -\frac{1}{2}(1 + \cos^2\theta) \cos 2\phi \cos 2\psi - \cos \theta \sin 2\phi \sin 2\psi, \quad (12)$$

$$F^\times(\theta, \phi, \psi) \equiv +\frac{1}{2}(1 + \cos^2\theta) \cos 2\phi \sin 2\psi - \cos \theta \sin 2\phi \cos 2\psi, \quad (13)$$

where ι is the inclination angle of the BBH orbit plane with respect to the observation direction, β is the longitude angle describing the observation direction in the source frame, (θ, ϕ) is the angular position of the BBH and ψ is the polarization angle of the GW. Equivalently h^{mem} denotes the overall GW memory projected to the detector.

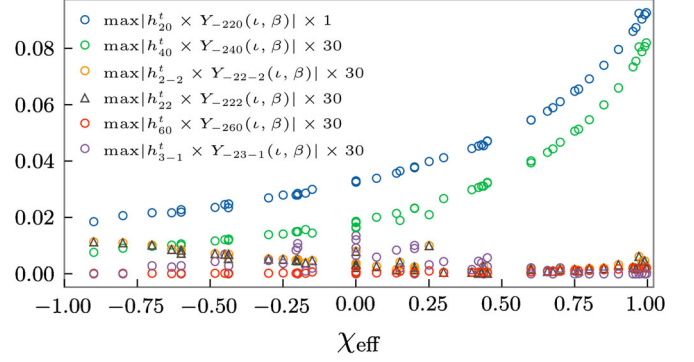


FIG. 2. Comparison of different memory modes contribution. The factor $Y_{-2lm}(\iota, \beta)$ corresponds to the effect of the spin weighted spherical harmonic function. The maximal is taken with respect to ι and β . This plot indicates that (2,0) mode is greater than the next strongest mode (4,0) more than 30 times.

Because of the approximation of GW memory by just (2,0) mode in (11), the parameter β can be ignored. Regarding the binary black hole coalescence systems the (2,0) mode overwhelmingly dominates the GW memory. The six leading contribution modes are compared in Fig. 2. We can see that (2,0) mode is stronger than the next strongest memory mode (4,0) more than 30 times. Consequently the approximation Eq. (11) is safely satisfied. For each BBH system, h_{20}^t is determined completely by the BBH intrinsic parameters $(q, \vec{\chi}_1, \vec{\chi}_2)$, where $q \geq 1$ is the mass ratio. We have calculated the corresponding memory according to Eq. (7) for 1370 simulations of generic, fully precessing BBHs with mass ratios $1 \leq q \leq 4$ and spin magnitudes $|\vec{\chi}_1|, |\vec{\chi}_2| < 0.8$. The resulting memory data $h_{20\text{NR}}^t$ are available online.¹

Based on the above 1370 GW memory results for generic fully precessing BBHs, we have constructed a surrogate model to describe the relation between the BBH intrinsic parameters $(q, \vec{\chi}_1, \vec{\chi}_2)$ and h_{20}^t . Our construction procedure closely follows [38,39]. Due to the precession, BH spins $\vec{\chi}_1, \vec{\chi}_2$ will change with time. We take the spin at time $t = -100M$ with respect to the merger time as the initial parameters which is the same as [38,39]. We randomly choose 1301 samples among the above-mentioned 1370 simulations to train and obtain a surrogate model NRSurMemory_7qd4. The rest of the 69 samples are used to check the accuracy of our model NRSurMemory_7qd4. The difference between $h_{20\text{NR}}^t$ and $h_{20\text{Sur}}^t$ for these 69 samples is plotted in the top panel of Fig. 3. Also, we notice that such difference will decrease along with mass ratio q and is independent of the spin parameters. In the meantime, we plot the estimated error by our Gaussian process regression type model NRSurMemory_7qd4 in the bottom panel of Fig. 3. We can see the estimated error

¹https://github.com/Zhi-ChaoZhao/NRSurMemory_7qd4/blob/main/Data_of_Paper/Training_Data.csv

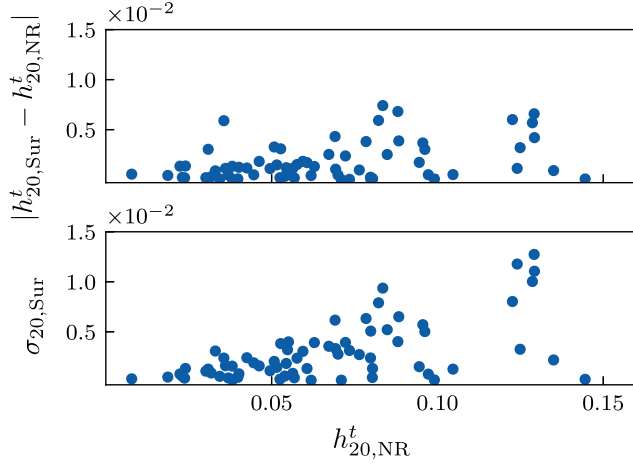


FIG. 3. Accuracy of the surrogate model `NRSurMemory_7qd4` against the 69 test samples. These 69 samples correspond to general BBHs including precessing ones. Top: the difference between the model prediction $h_{20, Sur}^t$ and the direct calculation result $h_{20, NR}^t$ through the Bondi-Metzner-Sachs method based on the numerical relativity simulations. Bottom: the estimated error by the `NRSurMemory_7qd4` model.

by the model `NRSurMemory_7qd4` is consistent with the difference between the model prediction and the numerical relativity result. This feature indicates the reliability of the `NRSurMemory_7qd4` model. The related PYTHON code and the model involved data of `NRSurMemory_7qd4` are also available online.²

Our surrogate model for memory is based on Gaussian process regression. Here we check the effect of the number of training data on the accuracy of the resulted surrogate model. In all we have 1370 numerical relativity results for GW memory based on SXS simulations. Denote the number of the training data $N < 1370$. We randomly take N samples from the 1370 results to train the surrogate model and use the rest $1370 - N$ samples as a test set. We repeat this process 50 times and average the resulted error. Here 50 is arbitrarily chosen and it does not affect the test result. We plot such averaged error with respect to N in Fig. 4. We found that when the number is larger than 1200, the results will not change any more. This is also the reason we chose 1301 samples for training above.

IV. GW MEMORY ESTIMATION OF THE BBH EVENTS IN GWTC-2

Given a distribution probability of parameters $(M, q, \vec{\chi}_1, \vec{\chi}_2, D, i, \theta, \phi, \psi)$ for a BBH system, our GW memory model (11) can result in an estimation of GW memory with a corresponding probability. For each detected BBH system by LIGO and VIRGO, the parameters $(M, q, \vec{\chi}_1, \vec{\chi}_2, D, i, \theta, \phi, \psi)$ can be estimated with a posterior

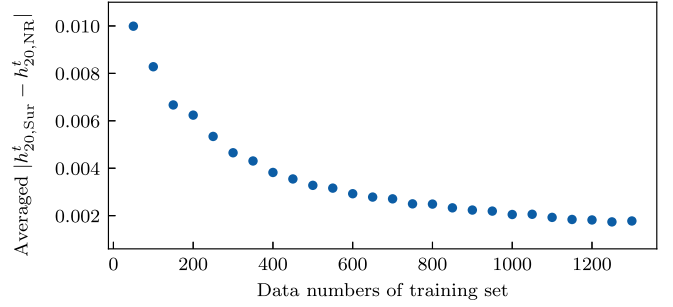


FIG. 4. The averaged accuracy of the surrogate model with respect to the number of training data. We have used 50 runs and taken the corresponding average.

probability based on a given prior probability [40]. So we can accordingly estimate the GW memory for each BBH event in GWTC-2. At the same time we can also present the corresponding prior and posterior probability for the GW memory. Different to our work, the authors in [22] estimated the intrinsic factor h_{20}^t only through the intrinsic parameters $(q, \vec{\chi}_1, \vec{\chi}_2)$ for O1/O2 BBH events.

The 38 BBH events during O3a have been announced in GWTC-2 [41] by the LIGO Scientific collaboration (LSC). The ten BBH events reported in the GWTC-1 [42] do not include the full information of black hole spin. We use the analysis results by the Bilby group [43] where the full information is available. We estimate the GW memory based on these two analysis results.

We first plot the posterior probability and the prior probability of (2,0) mode GW memory h_{20}^t for the 48 BBH events recorded in GWTC-2 in Fig. 5. Note that our h_{20}^t is different from Δh_{20} of [22], $h_{20}^t = \frac{D}{M} \Delta h_{20}$. For all events the posterior distribution of h_{20}^t is clearly different from that of the prior distribution. This means we have already well estimated (2,0) mode GW memory for the 48 BBH events. But this quantity cannot be related to any detection directly. That is why we consider the overall GW memory projected onto each detector h^{mem} in the current work.

We plot the prior distribution and the posterior distribution for h^{mem} of the 48 BBH events respectively in Fig. 6. The GW memory means the permanent change of the gravitational wave strain affected on each detector. So there are three plots corresponding to each BBH event. If the specific detector did not work properly when a BBH event happened the corresponding plot is absent.

In order to quantify how much information our GW memory estimation has gotten from the gravitational wave detection, we investigate the Kullback-Leibler (KL) divergence between the prior and posterior distribution. We plot the resulted KL divergences for the memory estimation with respect to the 48 BBH events in Fig. 7 and list the corresponding KL divergence in Table I. There are 16 events admitting KL divergence bigger than 1. These big KL divergences indicate that good information has been obtained by our GW memory estimation.

²https://github.com/Zhi-ChaoZhao/NRSurMemory_7qd4

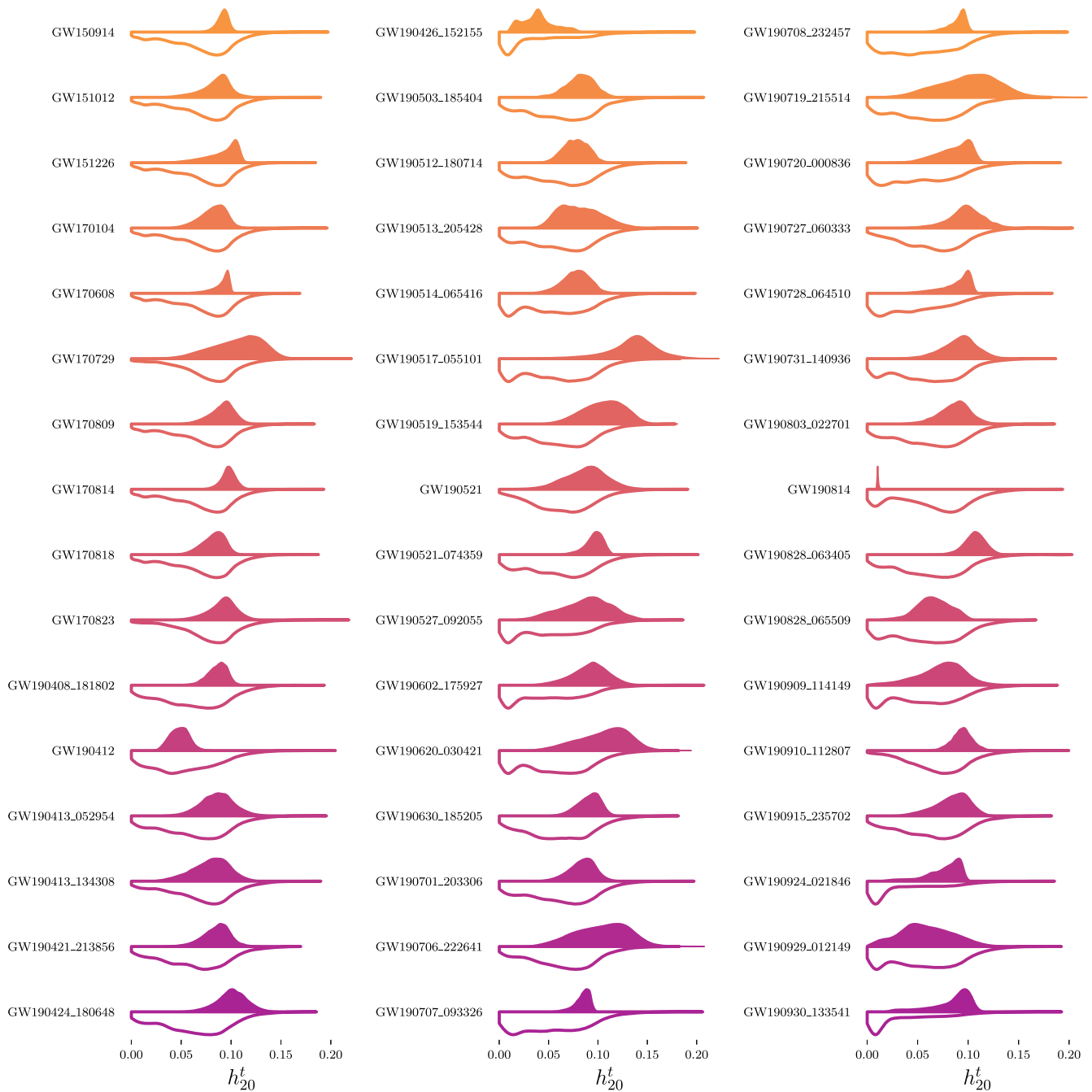


FIG. 5. The posterior probability and the prior probability of (2,0) mode GW memory for the 48 BBH events recorded in GWTC-2.

Among the above-mentioned 16 events with good memory estimation, we find that GW190412, GW190519_153544, GW190814 and GW190910_112807 admit clear nonvanishing mean values for the posterior distributions of the GW memory strain h^{mem} affected on each detector. All prior distributions are approximated Gaussian distribution with vanishing mean value. If the detection data gives little information to the memory, approximated Gaussian posterior distribution with vanishing mean value will be the result. Correspondingly small KL divergence will be obtained. In

contrast, if the detection data introduce significant information to the memory, the posterior distribution will admit nonvanishing mean value. GW190412, GW190519_153544, GW190814 and GW190910_112807 fall in this category. We show the violin plot for the prior and posterior distribution of the GW memory strain in Fig. 8. Due to the configurations of H1 and L1, we know the GW memory strains on H1 and L1 admit different signs. But Fig. 8 definitely tells us the signs of the GW memory affected on H1 and L1 for the first time.

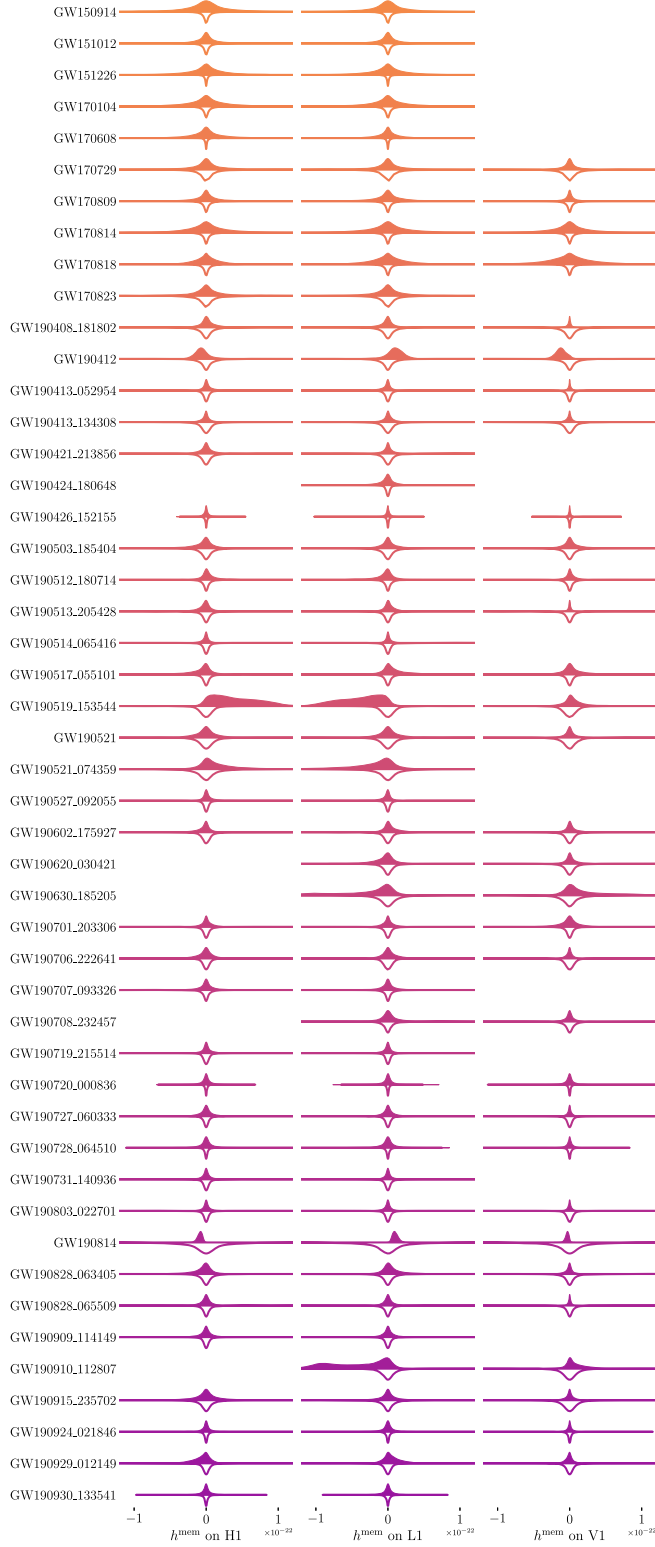


FIG. 6. The posterior probability and the prior probability of memory for the 48 BBH events recorded in GWTC-2 for the three detectors. For some events, some detectors were not working properly where the plot is absent.

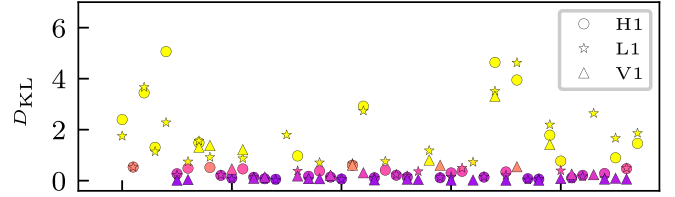


FIG. 7. KL divergence of the GW memory estimation for the 48 BBH events in GWTC-2. The horizontal axis corresponds to the 48 BBH events. For most events there are three estimation results corresponding to the three detectors, LIGO Hanford (H1), LIGO Livingston (L1) and VIRGO (V1).

V. THE EFFECT OF WAVEFORM MODEL ON THE ESTIMATION OF GRAVITATIONAL WAVE MEMORY

We surely know that the gravitational waveform model may affect the parameters estimation. People call such effect the systematic bias of the waveform template [44,45]. The most typical example is GW190521. A significant difference shows up among SEOBNR waveform families, IMRPhenom waveform families and NRsurrogate waveform model. These three waveform families are the most advanced waveform templates available to gravitational wave data analysis. The reported analysis results by LSC have already counted the waveform accuracy issue. In addition, LSC has also considered the waveform models combination and prior distribution of related parameters based on detailed astrophysical issues. Since the parameters estimation done by LSC group is extremely delicate; the posterior samples given by LSC are the most reasonable starting point for the application of our technique to the LIGO GW events. This is the guide idea for the GW memory estimation done in the above section.

But it is still interesting to ask how the waveform model and the prior distribution of related parameters affect the GW memory estimation. We do such investigation here.

A. The impact of waveform model systematics

In the GWTC-2 paper [46], the LSC group has released the posterior distribution of GW source parameters. The result of GW190412 used the combination of IMRPhenomPv3HM and SEOBNRv4PHM; the result of GW190519_153544 used the combination of NRsur7dq4 and SEOBNRv4PHM; the result of GW190814 used the combination of IMRPhenomPv3HM and SEOBNRv4PHM; and the result of GW190910_112807 used SEOBNRv4PHM.

In order to explore the effect of waveform models on our GW memory estimation, we use the individual posterior of the above-mentioned waveform models to estimate GW memory instead of using the combined posterior. The

TABLE I. The Kullback-Leibler (KL) divergence between the prior and posterior distribution for the GW memory strain h^{mem} affected on each detector of the 48 BBH events recorded in GWTC-2.

Event	$D_{\text{KL},\text{H1}}$	$D_{\text{KL},\text{L1}}$	$D_{\text{KL},\text{V1}}$	Event	$D_{\text{KL},\text{H1}}$	$D_{\text{KL},\text{L1}}$	$D_{\text{KL},\text{V1}}$
GW150914	2.394	1.748	...	GW190521_074359	0.410	0.761	...
GW151012	0.532	0.529	...	GW190527_092055	0.213	0.239	...
GW151226	3.441	3.662	...	GW190602_175927	0.135	0.185	0.057
GW170104	1.307	1.138	...	GW190620_030421	...	0.361	0.047
GW170608	5.060	2.278	...	GW190630_185205	...	1.180	0.809
GW170729	0.272	0.218	0.017	GW190701_203306	0.112	0.127	0.603
GW170809	0.488	0.745	0.041	GW190706_222641	0.303	0.149	0.021
GW170814	1.487	1.555	1.315	GW190707_093326	0.363	0.495	...
GW170818	0.515	0.918	1.378	GW190708_232457	...	0.723	0.025
GW170823	0.205	0.227	...	GW190719_215514	0.137	0.152	...
GW190408_181802	0.104	0.065	0.459	GW190720_000836	4.636	3.508	3.310
GW190412	0.460	0.869	1.214	GW190727_060333	0.342	0.211	0.018
GW190413_052954	0.132	0.132	0.090	GW190728_064510	3.946	4.622	0.546
GW190413_134308	0.074	0.049	0.144	GW190731_140936	0.077	0.037	...
GW190421_213856	0.054	0.024	...	GW190803_022701	0.061	0.058	0.017
GW190424_180648	...	1.795	...	GW190814	1.782	2.195	1.422
GW190426_152155	0.970	0.383	0.186	GW190828_063405	0.767	0.394	0.081
GW190503_185404	0.171	0.049	0.079	GW190828_065509	0.109	0.069	0.256
GW190512_180714	0.375	0.707	0.076	GW190909_114149	0.208	0.160	...
GW190513_205428	0.140	0.119	0.216	GW190910_112807	...	2.641	0.233
GW190514_065416	0.064	0.053	...	GW190915_235702	0.282	0.088	0.063
GW190517_055101	0.604	0.668	0.609	GW190924_021846	0.896	1.665	0.097
GW190519_153544	2.920	2.736	0.309	GW190929_012149	0.471	0.492	0.065
GW190521	0.114	0.113	0.031	GW190930_133541	1.459	1.861	...

results are plotted in Fig. 9. In this figure, we can see that different waveform models may affect the GW memory estimation. Just as the effect of waveform models on GW source parameters estimation [41], the result shown in Fig. 9 is consistent with our expectation. But we would like

to emphasize that the results reported in the above section are robust to waveform model choices. The interesting features of the GW memory of the four events do not change. The corresponding GW memory of GW190814 is always about -1×10^{-23} and 1×10^{-23} for the Hanford

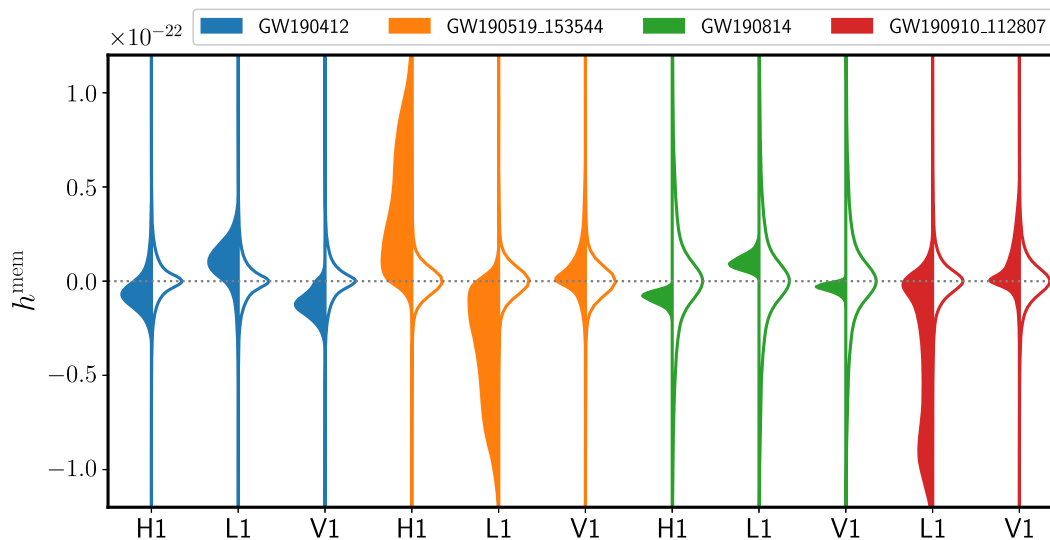


FIG. 8. Violin plot for the prior (right) and posterior (left) distribution of the GW memory h^{mem} for four BBH events in GWTC-2. The memory of these four BBH events has been estimated most accurately among the 48 BBH events of GWTC-2. The memory is with respect to specific detector. So each plot responds to a specific detector. During the time of the event GW190910_112807, H1 detector did not work well, so the corresponding plot is absent.

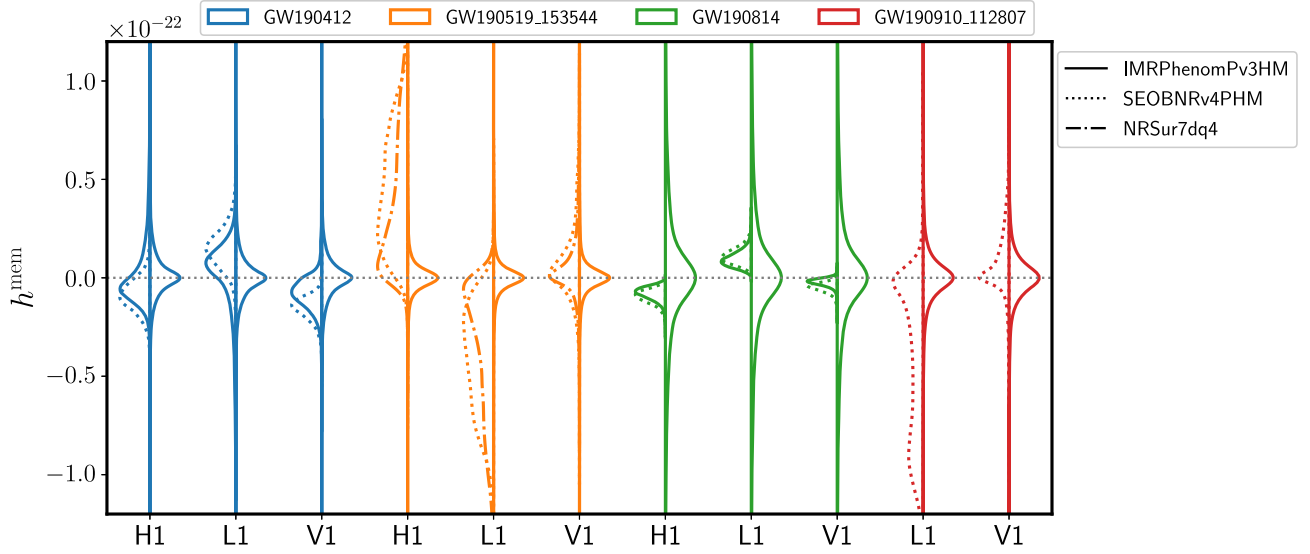


FIG. 9. GW memory estimations based on different waveform models. For each violin plot, the left panel corresponds to the posterior distribution and the right panel corresponds to the prior distribution. The three waveform models are IMRPhenomPv3HM, SEOBNRv4PHM, and NRSur7dq4 respectively which have been listed in the legend.

detector and the Livingston detector respectively which is independent of waveform models.

B. The effect of prior assumptions

According to Bayesian theorem, prior distribution may affect the posterior distribution. Here we check how the prior distribution assumptions would affect the GW memory estimation.

We use IMRPhenomXPHM [47] as the waveform model to check the dependence of GW memory estimation on the prior distribution. We use two different priors for the comparison. For both prior distributions, we take uniform distribution for the BH’s spin magnitudes and isotropic

distribution for the BH’s spin orientations, binary’s sky location and the orbital orientation. The prior distribution of the luminosity distance corresponds to a uniform merger rate in the comoving frame of the source. The difference of the two priors is about the masses of the two components. With prior A, we assume that the chirp mass is uniformly distributed. With prior B, we assume that the component masses of the binary are uniformly distributed. We plot the resulted distribution of the total mass M_{tot} and mass ratio q in Fig. 10 corresponding respectively to the two priors. From Fig. 10 we can see the two prior distributions with respect to the total mass M_{tot} and mass ratio q are significantly different to each other.

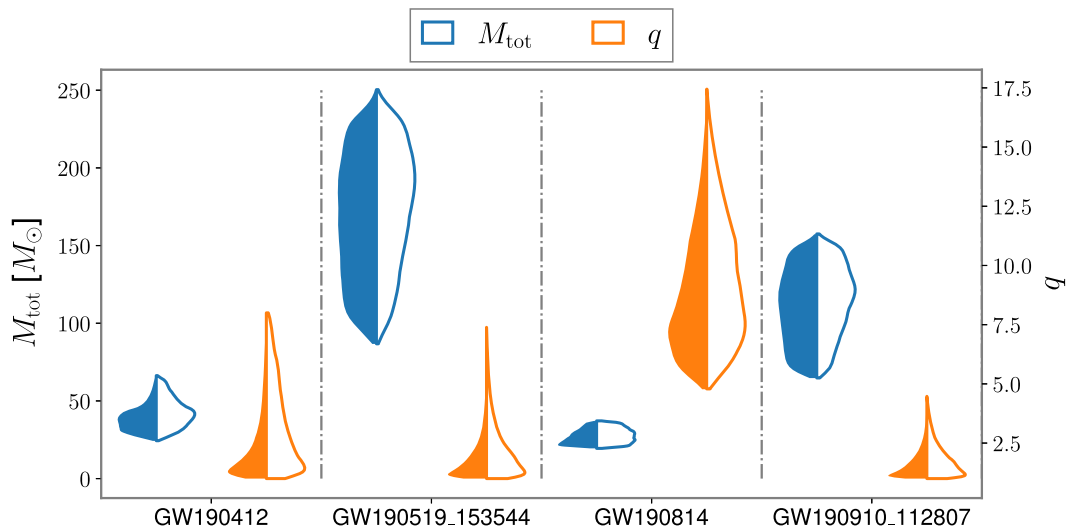


FIG. 10. Prior distribution of the total mass M_{tot} and the mass ratio q of the binary. The left panel of each violin plot corresponding to prior A, and the right panel of each violin plot corresponding to prior B. The blue violin plots are for M_{tot} , and the orange plots are for q .

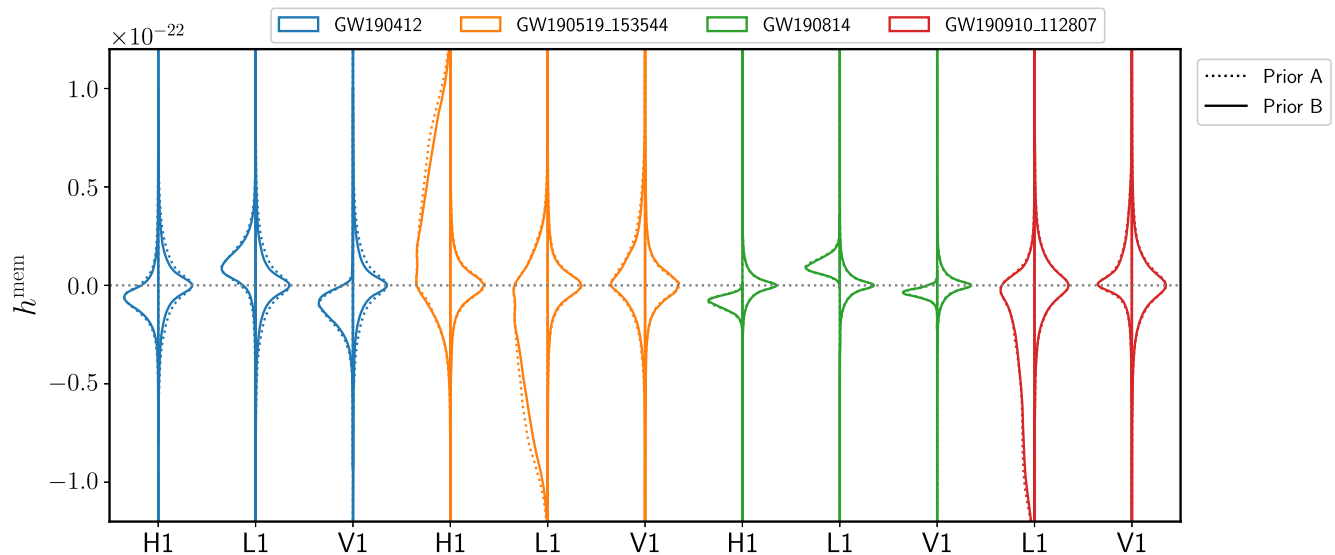


FIG. 11. GW memory estimations based on different prior distributions shown in Fig. 10. For each violin plot, the left panel corresponds to the posterior distribution and the right panel corresponds to the prior distribution. The corresponding prior distributions have been listed in the legend.

We plot the resulted GW memory estimation based on the two different prior distributions in Fig. 11. From this figure we can see the two GW memory estimation results are roughly the same when the prior distributions are significantly different as shown in Fig. 10. Such independent behavior of GW memory estimation on the prior distribution is consistent with the high KL divergence result obtained in the above section.

Based on the above analysis, we conclude that the estimated GW memory shown in Fig. 8 is robust to the waveform models and the prior assumptions.

VI. SUMMARY AND DISCUSSION

We have implemented a completely different GW memory measurement scheme compared to the existing works in the literature. In order to realize our measurement scheme, we have applied the Bondi-Metzner-Sachs method to accurately calculate the GW memory for BBH. Combining this method and the SXS numerical relativity simulation we construct a database to relate BBH initial parameters and the corresponding GW memory. Aided with this database we have constructed a Gaussian process regression type surrogate model `NRSurMemory_7qd4` for GW memory of BBH. With this powerful model, we have done an estimation of the GW memory for the 48 BBH events of GWTC-2. Different from the GW memory waveform models [23,48], our surrogate model `NRSurMemory_7qd4` describes the overall GW memory instead of the waveform.

Previous GW memory measurements targeted the nonoscillatory strain. There is no hope to detect GW memory in the near future with such a waveform analysis method [8]. The measurement method used in the current work is completely different [40]. The key bases for the

current method are the Bondi-Metzner-Sachs GW memory calculation technique and the powerful model `NRSurMemory_7qd4`.

Different from the previous qualitative estimate on the strength of GW memory [8,19], we present the first quantitative measurement of GW memory for the 48 BBH events in GWTC-2. Together with the median value, the posterior distribution of GW memory is also presented. According to the KL divergence between the prior distribution and the posterior distribution, we found 16 GW memory measurements are trustable. This feature is different from the behavior of kick velocity [40]. More interestingly we found 4 GW memory measurements definitely tell the signs of the memory on LIGO detectors. In the future, when other GW memory detection results are available [8], the comparison to our estimation can strongly constrain general relativity [10].

Our estimation technique and our estimation results presented in the current paper can guide people to more suitably choose the GW events for memory detection with multiple events. Aided with our estimation technique, the GW memory detection method with multiple events [19] will become easier to detect GW memory. In addition, the GW memory features found in our work can be used to strongly test general relativity together with the future GW memory detection.

ACKNOWLEDGMENTS

We thank Dr. He Wang for helpful discussions. This work was supported by the NSFC (No. 11690023 and No. 11920101003). Z. C. was supported by “the Interdiscipline Research Funds of Beijing Normal University” and the Strategic Priority Research Program of the Chinese Academy of Sciences, Grant No. XDB23040100. X. He was supported by NSF of Hunan province (No. 2018JJ2073).

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