

# A Derivation of the Likelihood Function for a Statistical $H_0$ Measurement

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## ABSTRACT

We derive the likelihood function for a “statistical” measurement of the Hubble constant that combines a distance measured by a gravitational wave (GW) observation and a catalog of redshifts from possible host galaxies measured by electromagnetic (EM) observations.

## 1. LIKELIHOOD

We have two data sets: a GW set  $d_{\text{GW}}$ , corresponding to a single detected GW event, and an EM data set  $d_{\text{EM}}$ , corresponding to a survey of galaxies that overlaps on the sky with the GW event’s inferred sky position. A likelihood function describes the generation of the GW data given GW parameters  $\theta_{\text{GW}}$  such as masses, spins, etc:

$$\mathcal{L}(\theta_{\text{GW}}) \equiv p(d_{\text{GW}} | \theta_{\text{GW}}). \quad (1)$$

Crucially, the luminosity distance to the event,  $d_L$ , and the position of the event on the sky  $\Omega_{\text{GW}}$  are among the GW parameters. Similarly, we have an EM likelihood that describes the generation of the survey data given parameters for the galaxies in the survey:

$$\mathcal{L}(\theta_{\text{EM}}) \equiv p(d_{\text{EM}} | \theta_{\text{EM}}). \quad (2)$$

Among the parameters for the EM survey are the redshifts of the galaxies  $\{z_i | i = 1, \dots, N_{\text{gal}}\}$  and also the positions of the galaxies on the sky  $\{\Omega_i | i = 1, \dots, N_{\text{gal}}\}$ .

The joint likelihood for the two sets of observations is just the product of the individual likelihoods because the data generating processes in each instrument are

independent of each other:

$$p(d_{\text{GW}}, d_{\text{EM}} \mid \theta_{\text{GW}}, \theta_{\text{EM}}) = p(d_{\text{GW}} \mid \theta_{\text{GW}}) p(d_{\text{EM}} \mid \theta_{\text{EM}}). \quad (3)$$

To measure the Hubble constant, we will not be concerned with the masses, spins, etc, of the GW source, nor with EM data besides the redshifts and sky positions, so let us impose some standard priors and integrate these variables out. This leaves us with a *marginal* likelihood for each observation expressed in terms of the luminosity distance, sky positions, and redshifts:

$$p(d_{\text{GW}} \mid d_L, \Omega_{\text{GW}}) p(d_{\text{EM}} \mid \{z_i, \Omega_i \mid i = 1, \dots, N_{\text{gal}}\}) = \int d\bar{\theta}_{\text{GW}} d\bar{\theta}_{\text{EM}} p(\bar{\theta}_{\text{GW}}) p(\bar{\theta}_{\text{EM}}) p(d_{\text{GW}} \mid \theta_{\text{GW}}) p(d_{\text{EM}} \mid \theta_{\text{EM}}), \quad (4)$$

where the “bar” indicates the set of ignorable parameters and  $p(\bar{\theta}_{\text{GW}})$  and  $p(\bar{\theta}_{\text{EM}})$  are the priors we impose on these parameters.

Now let us impose the constraint that one of the galaxies in the survey must have hosted the GW event; suppose that we weight the choice of hosts by a set of weights  $\{w_i \mid i = 1, \dots, N_{\text{gal}}\}$ . This constraint will tie together both pairs  $\Omega_{\text{GW}}$  and  $\Omega_i$  and  $d_L$  and  $z_i$ ; the relation between  $d_L$  and  $z_i$  depends on  $H_0$  (and other cosmological parameters). We can use these relationships to marginalize over (i.e. eliminate)  $d_L$  and  $\Omega_{\text{GW}}$  from the likelihood, obtaining for a single galaxy host,  $i$

$$p(d_{\text{GW}} \mid i, z_i, \Omega_i, H_0) \equiv \int dd_L d\Omega_{\text{GW}} p(d_{\text{GW}} \mid d_L, \Omega_{\text{GW}}) \delta(d_L - d_L(z_i, H_0)) \delta(\Omega_{\text{GW}} - \Omega_i). \quad (5)$$

The integrals are trivial, leaving

$$p(d_{\text{GW}} \mid i, z_i, \Omega_i, H_0) = p(d_{\text{GW}} \mid d_L(z_i, H_0), \Omega_i). \quad (6)$$

In the absence of other information, we do not know which galaxy hosted the GW event, so we should marginalize over the choice of galaxy,  $i$ , with the correct weights:

$$p(d_{\text{GW}} \mid \{z_i, \Omega_i \mid i = 1, \dots, N_{\text{gal}}\}, H_0) = \sum_{i=1}^{N_{\text{gal}}} w_i p(d_{\text{GW}} \mid d_L(z_i, H_0), \Omega_i). \quad (7)$$

Note that this is just the GW part of the likelihood, and it depends on the true redshifts and sky locations of the host galaxies. The galaxy redshifts and sky positions are nuisance parameters in an inference of  $H_0$  so we should marginalize over them with a suitable choice of prior, but first we must specify the EM likelihood since this also depends on those parameters. We assume that the EM data consists of independent measurements for each galaxy in the catalogue, with perfect sky location

determination and imperfect redshift determination, i.e.,

$$p(d_{\text{EM}} \mid \{z_i, \Omega_i \mid i = 1, \dots, N_{\text{gal}}\}) = \prod_{j=1}^{N_{\text{gal}}} \delta(\Omega_{j,\text{obs}} - \Omega_j) p(z_{j,\text{obs}} \mid z_j, \Omega_j) \quad (8)$$

in which we have now replaced  $d_{\text{EM}}$  by individual estimated sky locations,  $\Omega_{i,\text{obs}}$ , and redshifts,  $z_{i,\text{obs}}$ , for each galaxy  $i$ . To marginalise the true redshift and sky location out of the likelihood we need to specify a prior on these parameters. A natural prior would be to assume that galaxies are uniformly distributed in comoving volume and on the sky, so

$$p(z_i, \Omega_i) dz_i d\Omega_i = \frac{1}{4\pi V_{\text{max}}} \frac{dV}{dz_i} dz_i d\Omega_i \quad (9)$$

where  $V_{\text{max}}$  is some suitably large comoving volume that encompasses all galaxies in the survey. At sufficiently small redshifts,  $p(z_i) \propto z_i^2$ . Note that at *all* redshifts,  $p(z_i)$  is independent of  $H_0$ .

The above prior is needed for each galaxy and the combined prior for all galaxies is therefore  $\prod_j p(z_j, \Omega_j)$ . Finally, we arrive at the marginal likelihood for  $H_0$  given the joint observations:

$$\begin{aligned} p(d_{\text{GW}}, d_{\text{EM}} \mid H_0) &= \sum_{i=1}^{N_{\text{gal}}} w_i \prod_j \int dz_j d\Omega_j p(z_j, \Omega_j) p(d_{\text{GW}} \mid d_L(z_i, H_0), \Omega_i) \\ &\quad \times \delta(\Omega_{j,\text{obs}} - \Omega_j) p(z_{j,\text{obs}} \mid z_j, \Omega_j) \\ &= \sum_{i=1}^{N_{\text{gal}}} w_i \prod_j \int dz_j p(z_j, \Omega_{j,\text{obs}}) p(d_{\text{GW}} \mid d_L(z_i, H_0), \Omega_{i,\text{obs}}) \\ &\quad \times p(z_{j,\text{obs}} \mid z_j, \Omega_{j,\text{obs}}). \end{aligned} \quad (10)$$

The GW data term depends only on the galaxy  $i$  appearing in the sum. Therefore, most of the integrals can be evaluated directly. We introduce the evidences

$$\mathcal{Z}_j = \int p(z_{j,\text{obs}} \mid z, \Omega_{j,\text{obs}}) p(z, \Omega_{j,\text{obs}}) dz \quad (11)$$

and then the previous expression reduces to

$$\begin{aligned} p(d_{\text{GW}}, d_{\text{EM}} \mid H_0) &\propto \sum_{i=1}^{N_{\text{gal}}} w_i \int dz \frac{p(z, \Omega_{i,\text{obs}}) p(z_{i,\text{obs}} \mid z, \Omega_{i,\text{obs}})}{\mathcal{Z}_i} \\ &\quad \times p(d_{\text{GW}} \mid d_L(z, H_0), \Omega_{i,\text{obs}}). \end{aligned} \quad (12)$$

The first term inside the integral is the posterior on the true redshift of galaxy  $i$  based on the EM data and so this can be interpreted as using the EM data as a prior on the possible redshifts of the host of the GW source.

### 1.1. Selection Effects

So far, we have been ignoring selection effects. Selection effects can be modeled by including a factor,  $\beta(H_0)$  ensuring that the marginal likelihood integrates to one over all *detectable* data sets (Mandel et al. 2018). In other words, we write

$$p(d_{\text{GW}}, d_{\text{EM}} | H_0) = \frac{1}{\beta(H_0)} \sum_{i=1}^{N_{\text{gal}}} w_i \int dz_i d\Omega_i p(z_i, \Omega_i) p(d_{\text{GW}} | d_L(z_i, H_0), \Omega_i) \times p(d_{\text{EM}} | \{z_i, \Omega_i | i = 1, \dots, N_{\text{gal}}\}) \quad (13)$$

such that

$$\int dd_{\text{GW}} dd_{\text{EM}} P_{\text{det}}(d_{\text{GW}}) P_{\text{det}}(d_{\text{EM}}) p(d_{\text{GW}}, d_{\text{EM}} | H_0) = 1, \quad (14)$$

where  $P_{\text{det}}(d)$  refers to the probability that a particular data set  $d$  will result in a “detection” of a GW (typically,  $P_{\text{det}}$  is either 0 or 1, depending on the output of a pipeline applied to the data; it serves to truncate the integral to detectable data sets only). Thus,

$$\begin{aligned} \beta(H_0) = & \int dd_{\text{GW}} dd_{\text{EM}} P_{\text{det}}(d_{\text{GW}}) P_{\text{det}}(d_{\text{EM}}) \\ & \times \sum_{i=1}^{N_{\text{gal}}} w_i \int dz_i d\Omega_i p(z_i, \Omega_i) p(d_{\text{GW}} | d_L(z_i, H_0), \Omega_i) \\ & \times p(d_{\text{EM}} | \{z_i, \Omega_i | i = 1, \dots, N_{\text{gal}}\}). \end{aligned} \quad (15)$$

Note that the issue of selection effects has nothing to do with how “detectable” the observed events are (by definition, in the absence of a stochastic detection pipeline,  $P_{\text{det}}(d_{\text{GW,observed}}) \equiv 1$ ), but rather how the detectability of the *population* of GW events varies with  $H_0$ .

Current catalogs are complete (i.e.  $P_{\text{det}}(d_{\text{EM}}) = 1$ ) for any GW detection assuming reasonable values of  $H_0$ . In this document we assume that the galaxy catalog is selected from a flux-limited survey, so (to sufficient approximation) it is complete to some  $d_{L,\text{max}}$ ; this corresponds to a  $z_{\text{max}}(d_{L,\text{max}}, H_0)$  that depends on  $H_0$ . An alternative perspective is to assume that the catalogs are complete to some redshift  $z_{\text{max}}$  in which case  $d_{L,\text{max}}(z_{\text{max}}, H_0)$  depends on  $H_0$ . Final expressions for the likelihood are identical between these two approaches, but intermediate expressions differ in some places, as I note below.

Performing the integral over  $d_{\text{EM}}$  (remember that the EM likelihood is normalised), we obtain

$$\begin{aligned} \beta(H_0) = & \int dd_{\text{GW}} P_{\text{det}}(d_{\text{GW}}) \\ & \times \sum_{i=1}^{N_{\text{gal}}} w_i \int dz_i d\Omega_i p(z_i, \Omega_i) p(d_{\text{GW}} | d_L(z_i, H_0), \Omega_i). \end{aligned} \quad (16)$$

The integrals in each term of the sum are now all identical (only the EM data distinguishes the different galaxies) and the sum over weights is normalized, so we are left with

$$\beta(H_0) = \int dd_{\text{GW}} dz d\Omega P_{\text{det}}(d_{\text{GW}}) p(z, \Omega) p(d_{\text{GW}} | d_L(z, H_0), \Omega). \quad (17)$$

We can change variables from  $z$  to  $d_L$  in the integral, and integrate up to the GW horizon,  $d_{L,\text{max,GW}}$ , where  $P_{\text{det}}(d_{\text{GW}}) \rightarrow 0$ , obtaining

$$\beta(H_0) = \int dd_{\text{GW}} dd_L d\Omega P_{\text{det}}(d_{\text{GW}}) p(d_L, \Omega) p(d_{\text{GW}} | d_L, \Omega) = \frac{V(d_{L,\text{max,GW}})}{V(d_{L,\text{max}})} \quad (18)$$

But this latter integral is independent of  $H_0$  for Euclidean universes, and weakly dependent at larger distances under our assumption that the catalog is complete to some fixed  $d_{L,\text{max}}$ , so  $\beta(H_0) \simeq \text{const}$ ; had we assumed instead a maximum redshift for completeness, then  $d_{L,\text{max}}$  depends on  $H_0$  and  $\beta(H_0) \propto H_0^3$  as in [Fishbach et al. \(2018\)](#).

Eventually, EM catalogs will not be complete for all GW events. If only the set of GW events for which the EM catalog is complete is used to estimate  $H_0$  then  $\beta(H_0)$  can be computed by returning to Eq. (15). Alternately, the full set of GW events can be used, and a fictitious catalog members can be added with weights corresponding to the incompleteness fraction at various redshifts and in different directions; the limit of this procedure yields the formulas in [Fishbach et al. \(2018\)](#) for incomplete catalogs.

## 2. PRACTICAL CONSIDERATIONS

Evaluating Eq. (12) requires the ability to compute the GW marginal likelihood at arbitrary  $d_L$  and  $\Omega$ . Happily, a standard data product provided by LIGO ([Singer et al. 2016](#)) can be adapted to produce a function that approximates the marginal GW likelihood at fixed locations on the sky corresponding to HEALPix pixels ([Górski et al. 2005](#)). The method in [Singer et al. \(2016\)](#) fits the *posterior* over distance and sky position from a LIGO analysis using a per-pixel ansatz where

$$p(d_L, \Omega | d_{\text{GW}}) = \frac{\rho_i N_i}{A \sqrt{2\pi}\sigma_i} \exp\left[-\frac{1}{2} \left(\frac{d_L - \mu_i}{\sigma_i}\right)^2\right] d_L^2, \quad (19)$$

with  $\Omega$  in HEALPix pixel  $i$ ;  $N_i$ ,  $\rho_i$ ,  $\mu_i$ , and  $\sigma_i$  per-pixel fitting parameters; and  $A$  the area of the pixel. Since the standard LIGO distance prior is proportional to  $d_L^2$ , this means that the GW marginal likelihood when  $\Omega$  is in pixel  $i$  is (up to ignorable constants)

$$p(d_{\text{GW}} | d_L, \Omega) \propto \frac{\rho_i N_i}{A \sqrt{2\pi}\sigma_i} \exp\left[-\frac{1}{2} \left(\frac{d_L - \mu_i}{\sigma_i}\right)^2\right]. \quad (20)$$

(Note the missing factor of  $d_L^2$  relative to Eq. (19).)

If we are in the linear regime, where

$$d_L = \frac{cz}{H_0} \quad (21)$$

to sufficient accuracy, the EM likelihood is Gaussian in the redshift,

$$p(d_{\text{EM}} | z_i, \Omega_i) \propto \frac{1}{\sqrt{2\pi}\sigma_{z,i}} \exp \left[ -\frac{1}{2} \left( \frac{z_i - z_{i,\text{obs}}}{\sigma_{i,z}} \right)^2 \right], \quad (22)$$

and we assume that the EM data determines the sky position of each galaxy precisely, then the marginalization integrals over redshift and sky position in Eq. (12) can be performed analytically, as we now show. The evidence integral, assuming a  $p(z_i) \propto z_i^2$  prior becomes

$$\mathcal{Z}_i = \int dz_i z_i^2 \frac{1}{\sqrt{2\pi}\sigma_{z,i}} \exp \left[ -\frac{1}{2} \left( \frac{z_i - z_{i,\text{obs}}}{\sigma_{i,z}} \right)^2 \right] = \sigma_{i,z}^2 + z_{i,\text{obs}}^2. \quad (23)$$

The result, when galaxy  $i$  lies inside pixel  $k_i$ , is

$$p(d_{\text{GW}} | d_{\text{EM}}, H_0) = \frac{3H_0^3}{z_{\text{max}}^3} \sum_{i=1}^{N_{\text{gal}}} \frac{w_i \rho_{k_i} N_{k_i}}{A \sqrt{2\pi} \Sigma \mathcal{Z}_i} \exp \left[ -\frac{(H_0 \mu_{k_i} - cz_{i,\text{obs}})^2}{2\Sigma^2} \right] \times \left( \frac{\sigma_{k_i}^2 \sigma_{i,z}^2}{\Sigma^2} + \frac{(c\mu_{k_i} \sigma_{i,z}^2 + H_0 \sigma_{k_i}^2 z_{i,\text{obs}})^2}{\Sigma^4} \right), \quad (24)$$

with

$$\Sigma^2 = H_0^2 \sigma_{k_i}^2 + c^2 \sigma_{i,z}^2. \quad (25)$$

We are assuming that the galaxy catalog is complete to some  $d_{L,\text{max}}$ , so the factor  $H_0/z_{\text{max}}$  is independent of  $H_0$  and equal to  $c/d_{\text{max}}$ :

$$p(d_{\text{GW}} | d_{\text{EM}}, H_0) = \frac{3c^3}{d_{L,\text{max}}^3} \sum_{i=1}^{N_{\text{gal}}} \frac{w_i \rho_{k_i} N_{k_i}}{A \sqrt{2\pi} \Sigma \mathcal{Z}_i} \exp \left[ -\frac{(H_0 \mu_{k_i} - cz_{i,\text{obs}})^2}{2\Sigma^2} \right] \times \left( \frac{\sigma_{k_i}^2 \sigma_{i,z}^2}{\Sigma^2} + \frac{(c\mu_{k_i} \sigma_{i,z}^2 + H_0 \sigma_{k_i}^2 z_{i,\text{obs}})^2}{\Sigma^4} \right). \quad (26)$$

If, alternately, we had assumed that the catalog is complete to some  $z_{\text{max}}$  then  $\beta(H_0) \propto H_0^3$  and this factor would cancel the  $H_0^3$  in the numerator, again leading to a likelihood that lacks a pre-factor dependent on  $H_0$ . Both approaches agree on the likelihood *when the selection effects are dominated by the GW horizon*.

It is reasonable to truncate the sum above by ignoring galaxies for which  $\rho_{k_i}$  (the integrated per-pixel GW posterior probability) is sufficiently small.

### 2.1. The Uninformative Limit

In the limit where the individual redshift measurements are too uncertain to meaningfully constrain  $H_0$ , the measurement should be uninformative. In this limit

$$H_0^2 \sigma_{k_i}^2 \ll c^2 \sigma_{z,i}^2 \rightarrow \infty \quad (27)$$

in the relevant pixels. Since the  $c^2 \sigma_{i,z}^2$  term dominates  $\Sigma$  and also eliminates the exponential, the likelihood function for  $H_0$  becomes constant and the measurement is uninformative about  $H_0$ .

### 2.2. The Maximally Informative Limit

Suppose there is only a single galaxy in the entire sky area (maybe our sky area is very small, or maybe we have an EM counterpart that eliminates all the galaxies in the catalog but one). Then the sum collapses to one term, and the pixel-dependent parts become ignorable constants, so

$$p(d_{\text{GW}} | d_{\text{EM}}, H_0) \propto \frac{1}{\sqrt{2\pi}\Sigma\mathcal{Z}_i} \exp \left[ -\frac{(H_0\mu_{k_i} - cz_{i,\text{obs}})^2}{2\Sigma^2} \right] \times \left( \frac{\sigma_{k_i}^2 \sigma_{i,z}^2}{\Sigma^2} + \frac{(c\mu_{k_i} \sigma_{i,z}^2 + H_0 \sigma_{k_i}^2 z_{i,\text{obs}})^2}{\Sigma^4} \right). \quad (28)$$

If we now imagine that  $c\sigma_{i,z} \ll H_0\sigma_{k_i}$  for all reasonable values of  $H_0$  and that  $\sigma_{i,z} \ll z_{i,\text{obs}}$ , then we do not distinguish any more between  $z_{i,\text{obs}}$  and  $z_i$  and the likelihood becomes

$$p(d_{\text{GW}} | d_{\text{EM}}, H_0) \propto \frac{1}{\sqrt{2\pi}H_0\sigma_{k_i}} \exp \left[ -\frac{(H_0\mu_{k_i} - cz_i)^2}{2H_0^2\sigma_{k_i}^2} \right] \left( \frac{1}{H_0^2} \right). \quad (29)$$

If the GW measurement becomes infinitely precise as well, then  $\sigma_{k_i} \rightarrow 0$ , and the likelihood becomes

$$p(d_{\text{GW}} | d_{\text{EM}}, H_0) \propto \delta(H_0\mu_{k_i} - cz_i) \left( \frac{1}{H_0^3} \right), \quad (30)$$

which selects  $H_0 = cz_i/\mu_{k_i}$  as expected.

### 2.3. The Many Galaxies Limit

Suppose there are so many galaxies within the GW region on the sky that we can treat them as being continuously distributed with density  $p(z) \propto z^2$ . To make the expressions tractable, suppose the measurement uncertainty on redshift is small,  $\sigma_{i,z} \rightarrow 0$  and that the GW source is localized to a single pixel  $k$ . Then the GW likelihood becomes

$$p(d_{\text{GW}} | d_{\text{EM}}, H_0) \propto \sum_i \frac{w_i}{\sqrt{2\pi}H_0^3\sigma_k} \exp \left[ -\frac{(H_0\mu_k - cz_i)^2}{2H_0^2\sigma_k^2} \right]. \quad (31)$$

Note that the evidence term  $\mathcal{Z}_i$  has cancelled the  $z_i^2$  appearing from the prior we placed on the true redshift of each galaxy. There are so many galaxies that the sum over galaxies becomes an integral, leading to

$$p(d_{\text{GW}} | d_{\text{EM}}, H_0) \propto \int dz \frac{p(z)}{\sqrt{2\pi} H_0^3 \sigma_k} \exp \left[ -\frac{(H_0 \mu_k - cz)^2}{2H_0^2 \sigma_k^2} \right] \propto \text{const.} \quad (32)$$

In other words, if the distribution of galaxies is uniform across the GW localization region then the measurement is uninformative.

I thank Maya Fishbach, Daniel Holz, and Jolien Creighton for their input and cross-checking during the preparation of this manuscript; any errors that remain are, of course, entirely my fault!

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