

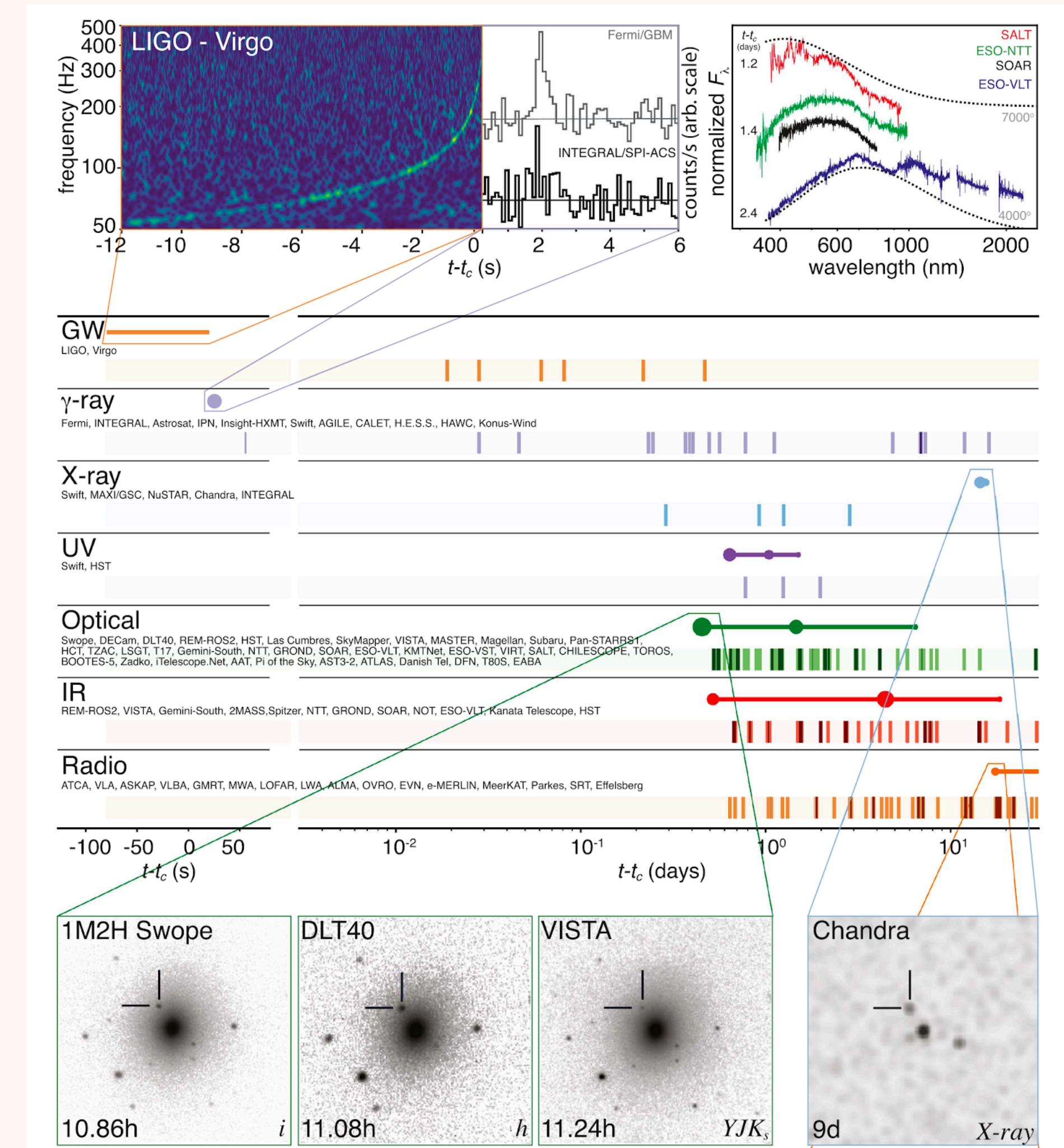
SKY LOCALIZATION BY BAYESTAR

CONTENTS

- **Multi-Message Astrophysics**
 - **Skymap of GW170817**
 - **Skymap Resolutions**
 - **BAYESTAR**
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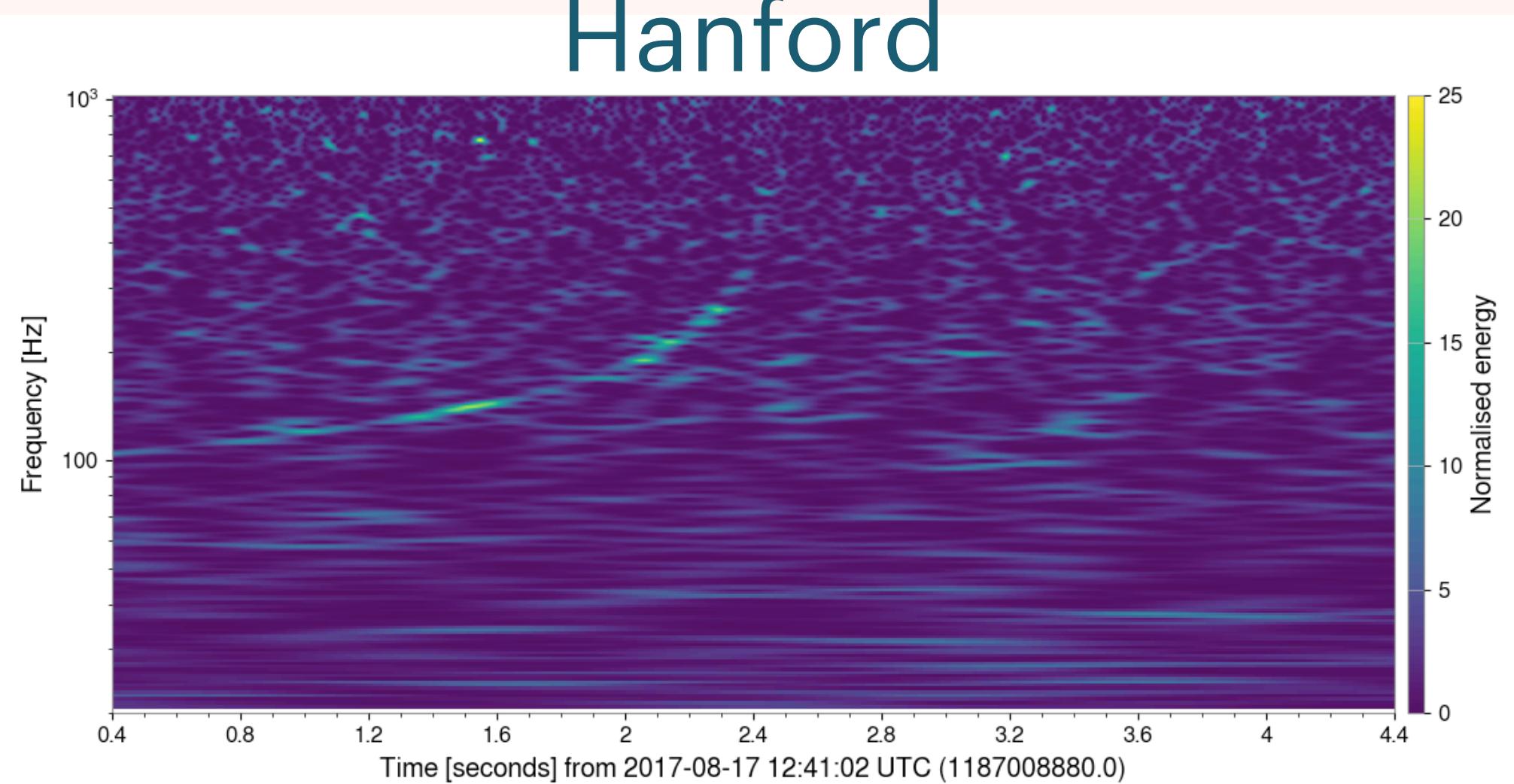
WHY IS SKY LOCALIZATION IMPORTANT

- The early alert from the GW detector can provide EM counterpart information to the optic telescope.
- The follow-up gamma-ray burst was detected 2 seconds after the merger.
- Fast parameter estimation that provides the sky location for the optic telescope to point at is required for multi-messenger astrophysics(MMA) study

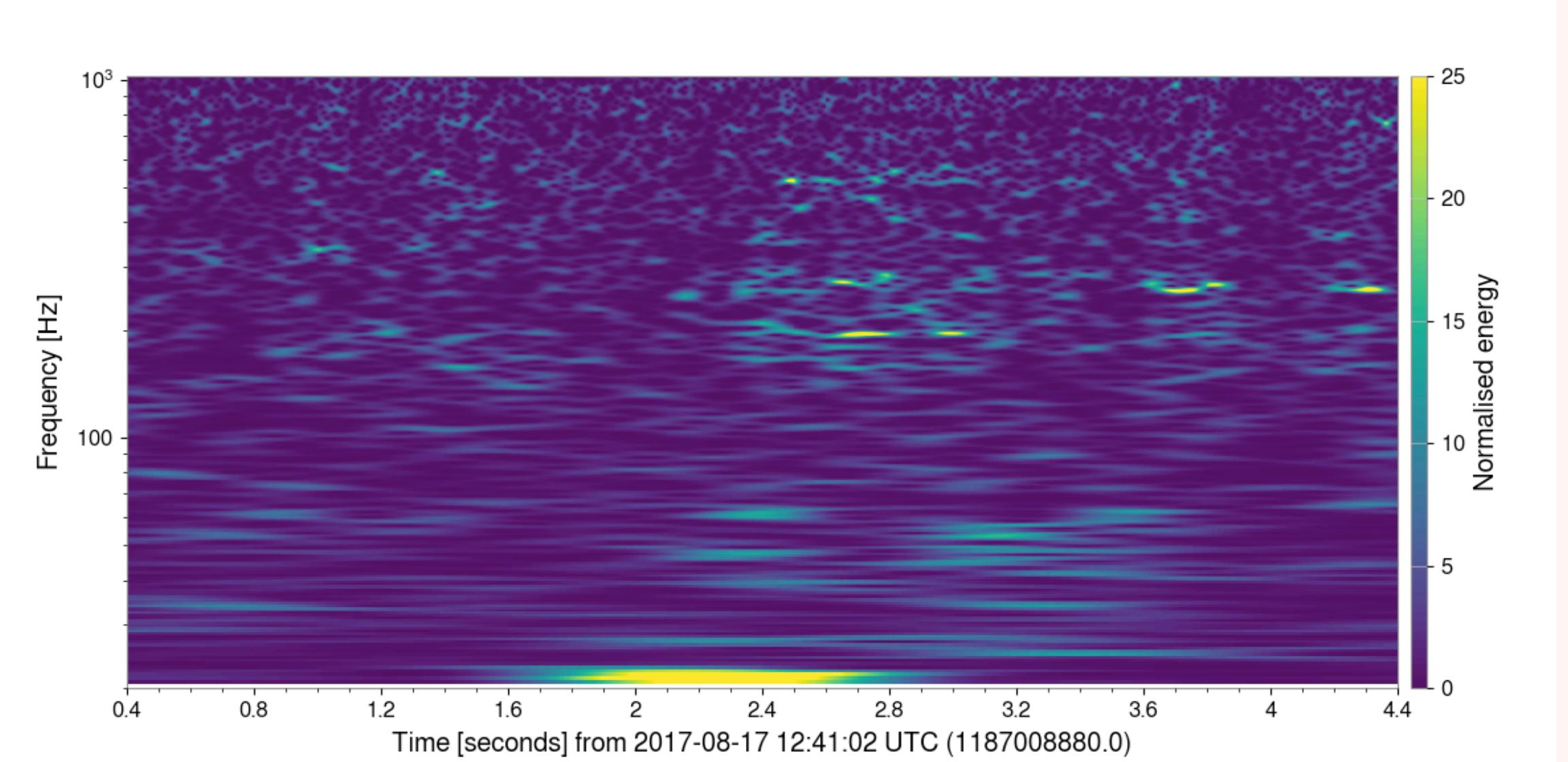


DETECTION OF GW170817

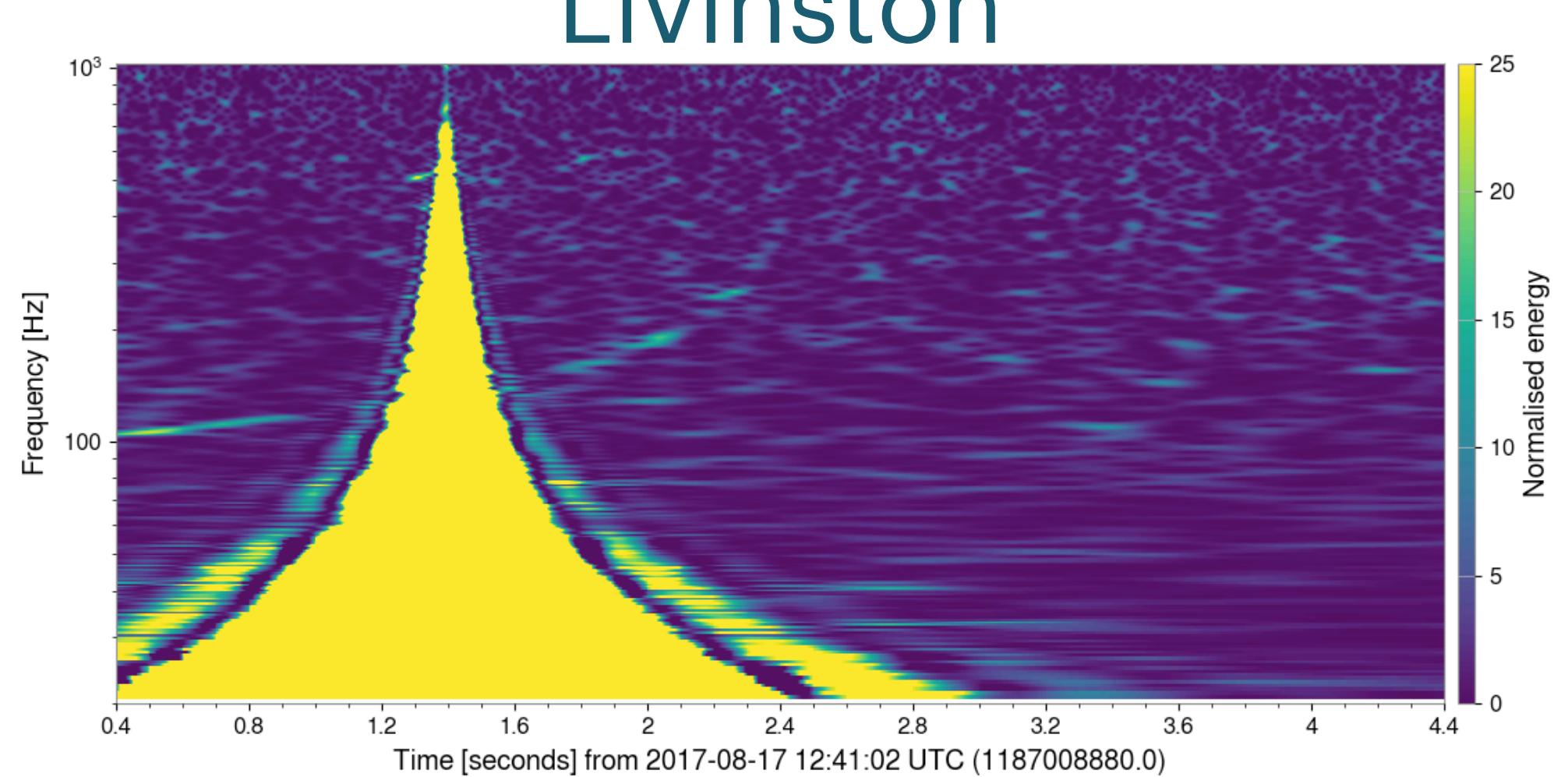
Hanford



Virgo

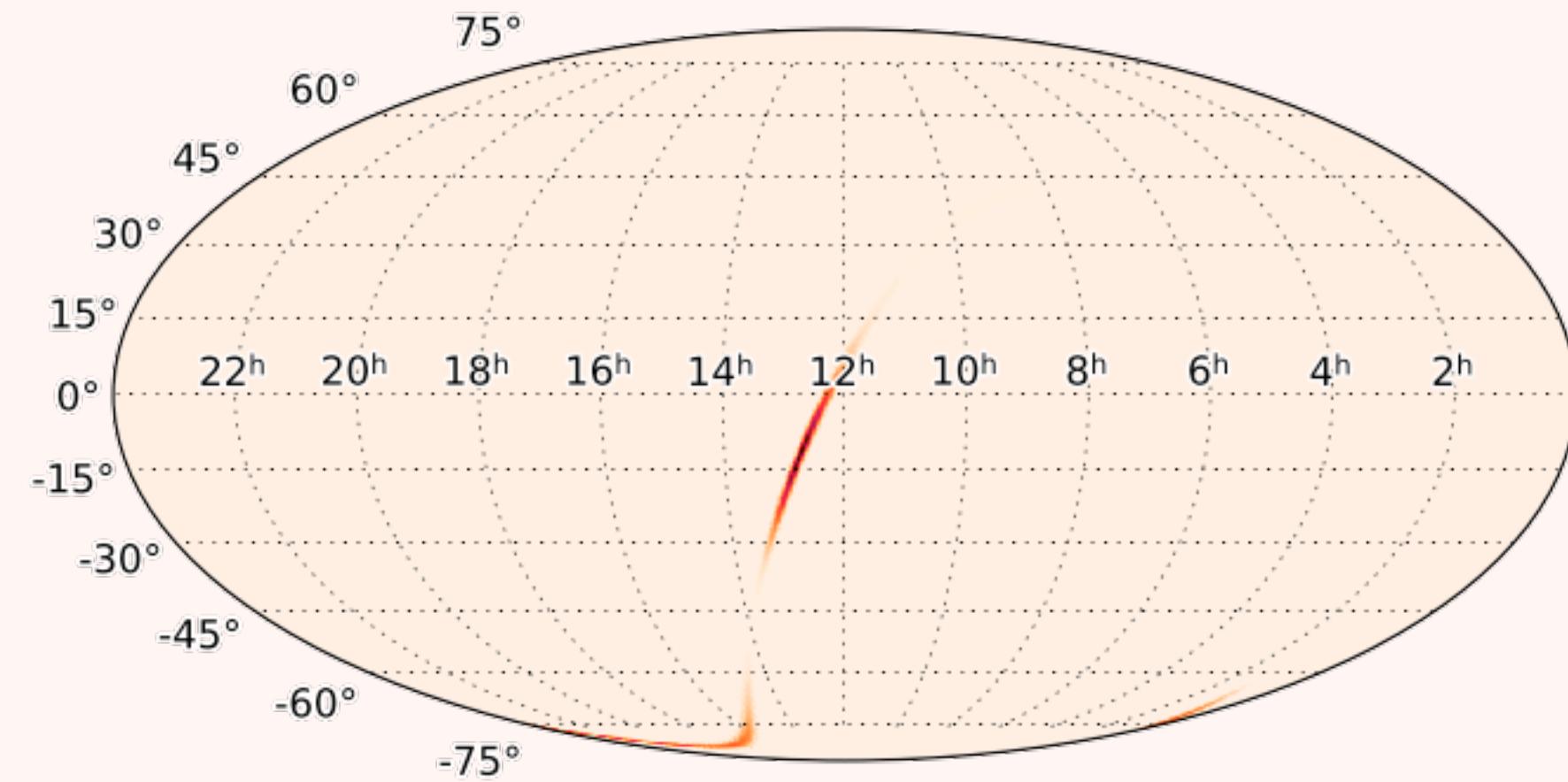


Livinston

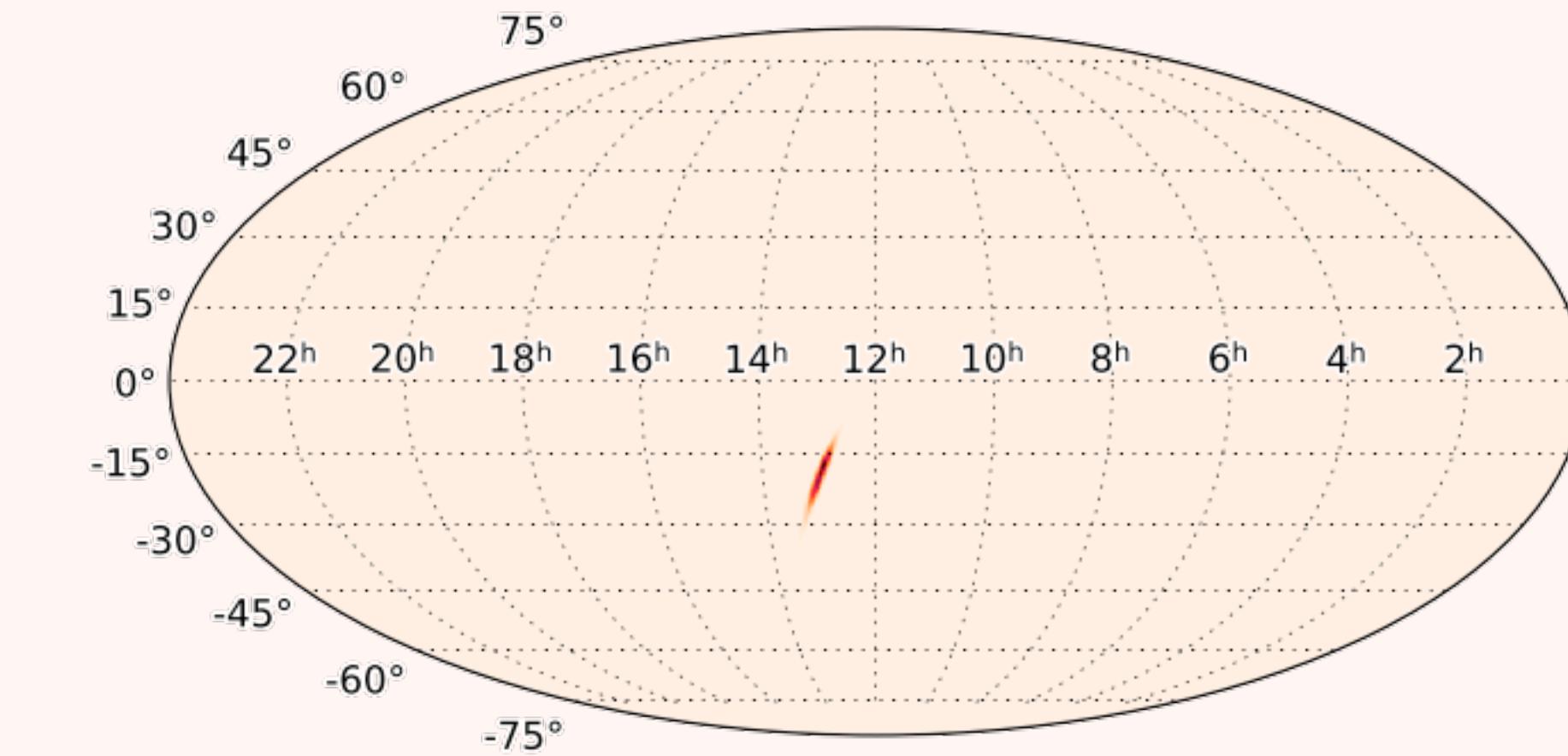


SKY LOCATION WITH & WITHOUT VIRGO

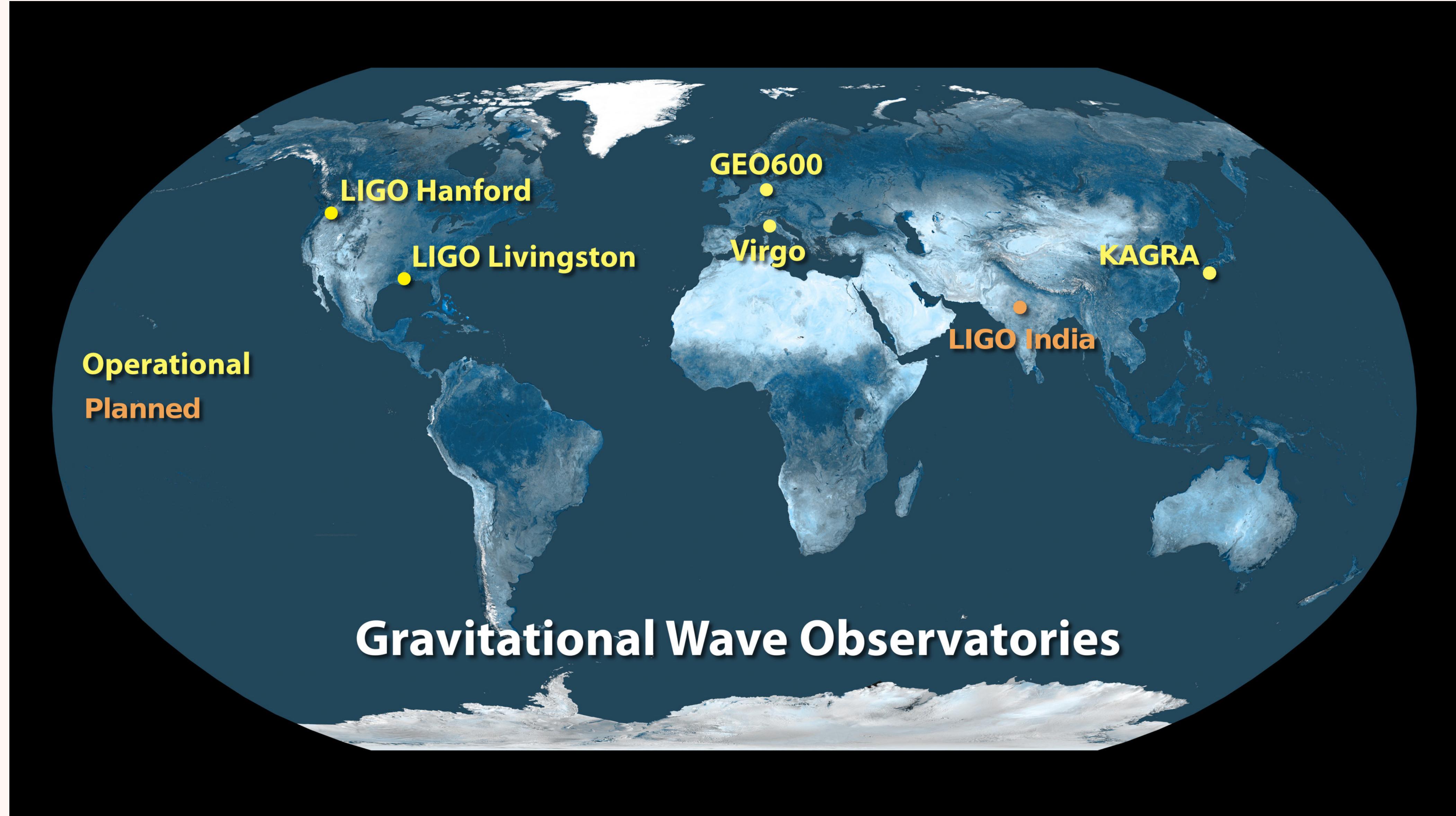
Skymap without Virgo data



Skymap with Virgo data

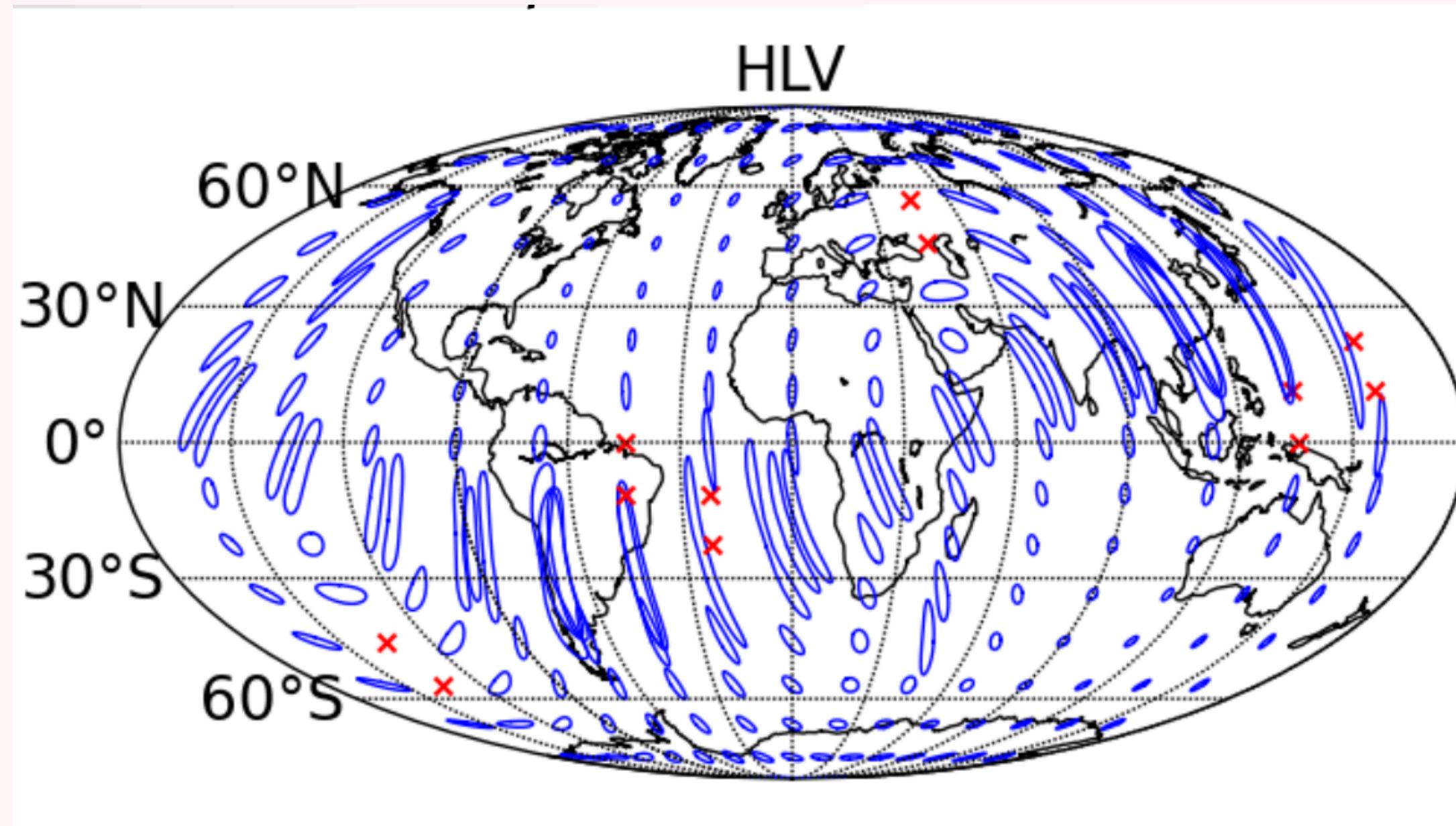


<https://dcc.ligo.org/LIGO-G1701985/public>

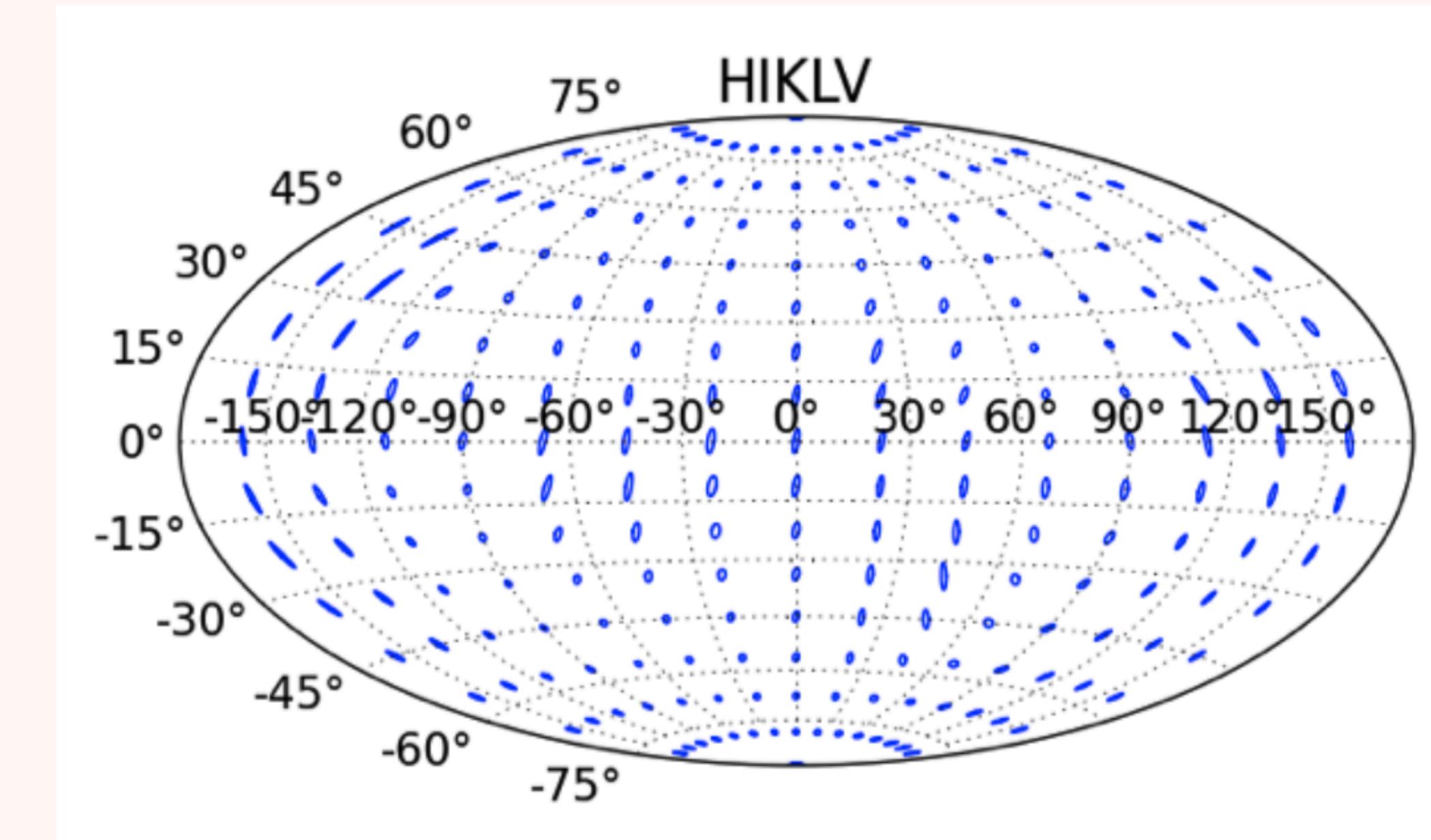


RESOLUTIONS OF SKYMAP

LIGO-Virgo joint observation



LIGO-Virgo-KAGRA joint observation



https://indico.in2p3.fr/event/16310/contributions/60642/attachments/48045/60588/FuturGW_SVOM2018_Leroy.pdf

TO ARCHIVE MMA

- **Loud enough gravitational wave with EM follow up**
- **Coincident detection across multiple detectors**
- **Fast and accurate sky localization parameter estimation**

BAYESTAR

BAYES' THEOREM

$$P(A | B) = \frac{P(B | A)P(A)}{P(B)}$$

- *Posterior* : $P(A | B)$
- *Likelihood* : $P(B | A)$
- *Prior* : $P(A)$
- *Evidence* : $P(B)$
- $A = \theta; B = \mathbf{Y}$

- **The ultimate goal of parameter estimation is to find a set of parameters that maximize the likelihood $\mathcal{L}(\mathbf{Y}; \theta)$ given the prior distribution**

$$\mathcal{L}(\mathbf{Y}; \theta) = \prod_i p(Y_i | \theta), \quad i : \text{detector}$$

LIKELIHOOD FUNCTION

Time series strain data of the i th detector can express as $y_i = x_i(t; \theta) + n_i(t)$

And its Fourier transform can express as $Y_i(\omega) = \int_{-\infty}^{\infty} y(t)e^{-i\omega t} dt = X_i(\omega; \theta) + N_i(\omega)$

The likelihood can express as:

$$\mathcal{L}(\mathbf{Y}; \theta) = \prod_i p(Y_i | \theta), \quad i : \text{detector} ;$$

$$p(Y_i | \theta) \propto \exp\left[-\frac{1}{2} \sum_i \int_0^{\infty} \frac{|Y_i(\omega) - X_i(\omega; \theta)|^2}{S_i(\omega)} d\omega\right]$$

With $X(\omega; \theta)$ as the projected hypothesis waveform

WAVEFORM PARAMETERS θ

Extrinsic parameters : θ_{ex}

α : right ascension

δ : declination

r : distance

t_a : arrival time at geocenter

ι : inclination angle

ψ : polarization angle

ϕ_c : coalescence phase

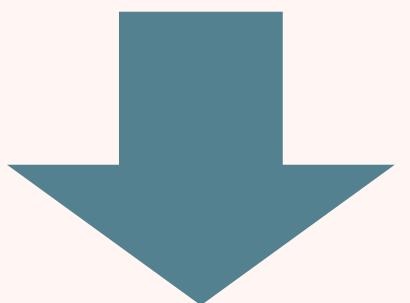
Intrinsic parameters : θ_{in}

m_1 : first component's mass

m_2 : second component's mass

S_1 : first component's spin

S_2 : second component's spin



$$H(\omega; \theta_{in})$$

GW WAVEFORMS IN DETECTOR

$$X_i(\omega; \theta) = e^{-i\omega(t_a - \mathbf{d}_i \cdot \mathbf{n})} \frac{r_{1,i}}{r} e^{2i\phi_c} \left[\frac{1}{2} (1 + \cos^2 i) \mathcal{R}\{\zeta\} - i(\cos(i)) \mathcal{I}\{\zeta\} \right] H(\omega; \theta_{in})$$

$$\zeta = e^{-2i\psi} (F_{+,i}(\alpha, \delta, t_a) + i F_{\times,i}(\alpha, \delta, t_a))$$

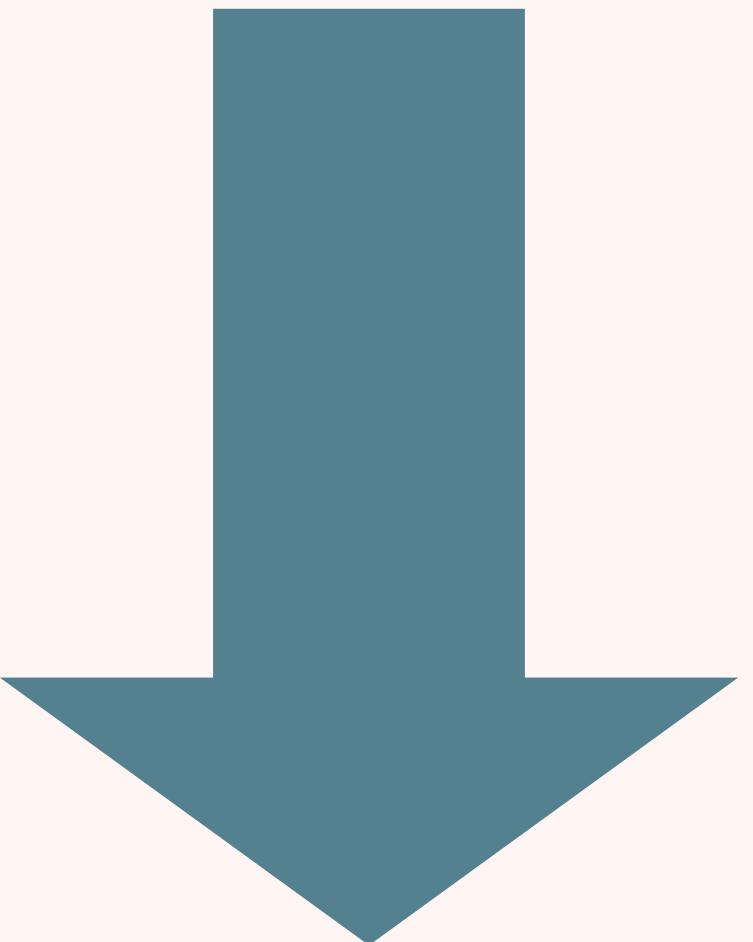
With the antenna pattern as $F_{+,i}, F_{-,i}$

GW WAVEFORMS IN DETECTOR

$$X_i(\omega; \theta) = e^{-i\omega(t_a - d_i \cdot \mathbf{n})} \frac{r_{1,i}}{r} e^{2i\phi_c} \left[\frac{1}{2} (1 + \cos^2 \iota) \mathcal{R}\{\zeta\} - i(\cos(\iota)) \mathcal{I}\{\zeta\} \right] H(\omega; \theta_{in})$$

$$r_{1,i} = \frac{1}{\sigma_i}$$

$$\sigma_i^2 = \int_0^\infty \frac{|H(\omega; \theta_{in})|^2}{S_i(\omega)} d\omega$$



ρ_i : *amplitude*

γ_i : *phase*

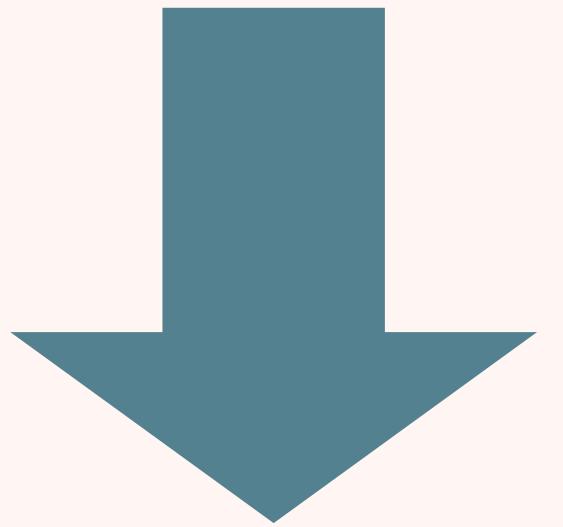
τ_i : *time delay*

$$X_i(\omega; \theta_i, \theta_{in}) = X_i(\omega; \rho_i, \gamma_i, \tau_i, \theta_{in}) = \frac{\rho_i}{\sigma_i} e^{i(\gamma_i - \omega \tau_i)} H(\omega; \theta_{in})$$

AUTOCORRELATION LIKELIHOOD

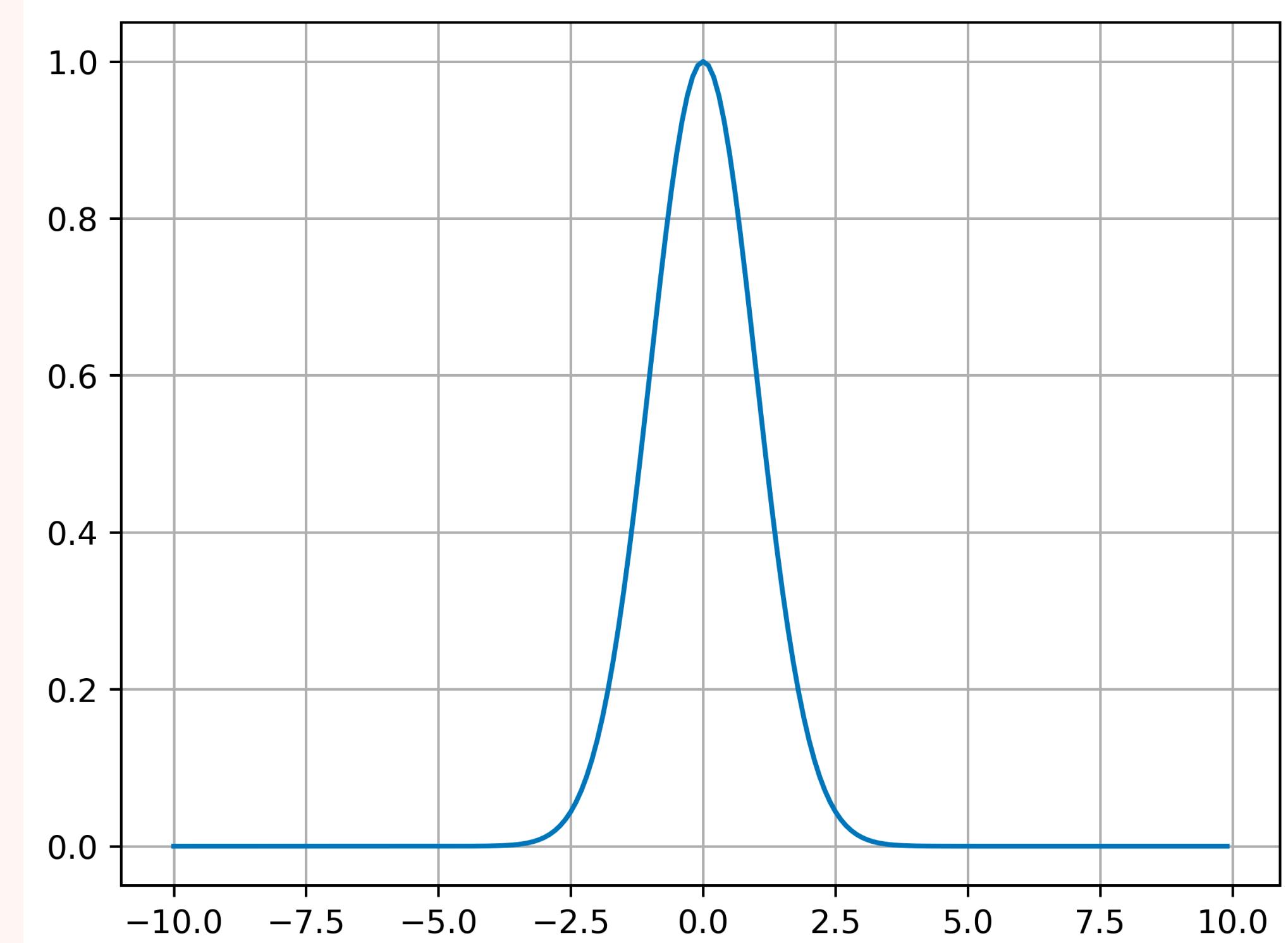
Likelihood

$$p(Y_i|\theta) \propto \exp\left[-\frac{1}{2} \sum_i \int_0^\infty \frac{|Y_i(\omega) - X_i(\omega; \theta)|^2}{S_i(\omega)} d\omega\right]$$



Autocorrelation likelihood

$$p(\hat{\theta}_i|\theta) := p(Y_i(\omega) = X_i(\omega; \hat{\theta}|\theta))$$



AUTOCORRELATION LIKELIHOOD

$$p(Y_i|\theta) \propto \exp\left[-\frac{1}{2} \sum_i \int_0^\infty \frac{|Y_i(\omega) - X_i(\omega; \theta)|^2}{S_i(\omega)} d\omega\right]$$

New likelihood to estimate:

$$p(\hat{\theta}_i|\theta) := p(Y_i(\omega) = X_i(\omega; \hat{\theta}|\theta))$$

$$\propto \exp\left[-\frac{1}{2} \int_0^\infty \left| \frac{\hat{\rho}_i}{\sigma_i(\hat{\theta}_{in})} e^{i(\hat{\gamma}_i - \omega \hat{\tau}_i)} \frac{H(\omega; \hat{\theta}_{in})}{S_i(\omega)} - \frac{\rho_i}{\sigma_i(\theta_{in})} e^{i(\gamma_i - \omega \tau_i)} \frac{H(\omega; \theta_{in})}{S_i(\omega)} \right|^2 d\omega\right]$$

AUTOCORRELATION LIKELIHOOD

We assume that $\theta_{in} = \hat{\theta}_{in}$

$$p(\hat{\rho}_i, \hat{\gamma}_i, \hat{\tau}_i | \rho_i, \gamma_i, \tau_i) \propto \exp\left[-\frac{1}{2}\hat{\rho}_i^2 - \frac{1}{2}\rho_i^2 + \hat{\rho}_i\rho_i \Re\{e^{i\tilde{\gamma}_i}a_i^*(\tilde{\tau}_i)\}\right]$$

$\tilde{\gamma}_i = \hat{\gamma}_i - \gamma_i$, $\tilde{\tau}_i = \hat{\tau}_i - \tau_i$ are the errors produced when making the assumption

$$a_i(t; \theta_{in}) := \frac{1}{\sigma_i^2(\theta_{in})} \int_0^\infty \frac{|H(\omega; \hat{\theta}_{in})|^2}{S_i(\omega)} e^{i\omega t} d\omega$$
 is the autocorrelation function

MARGINAL POSTERIOR

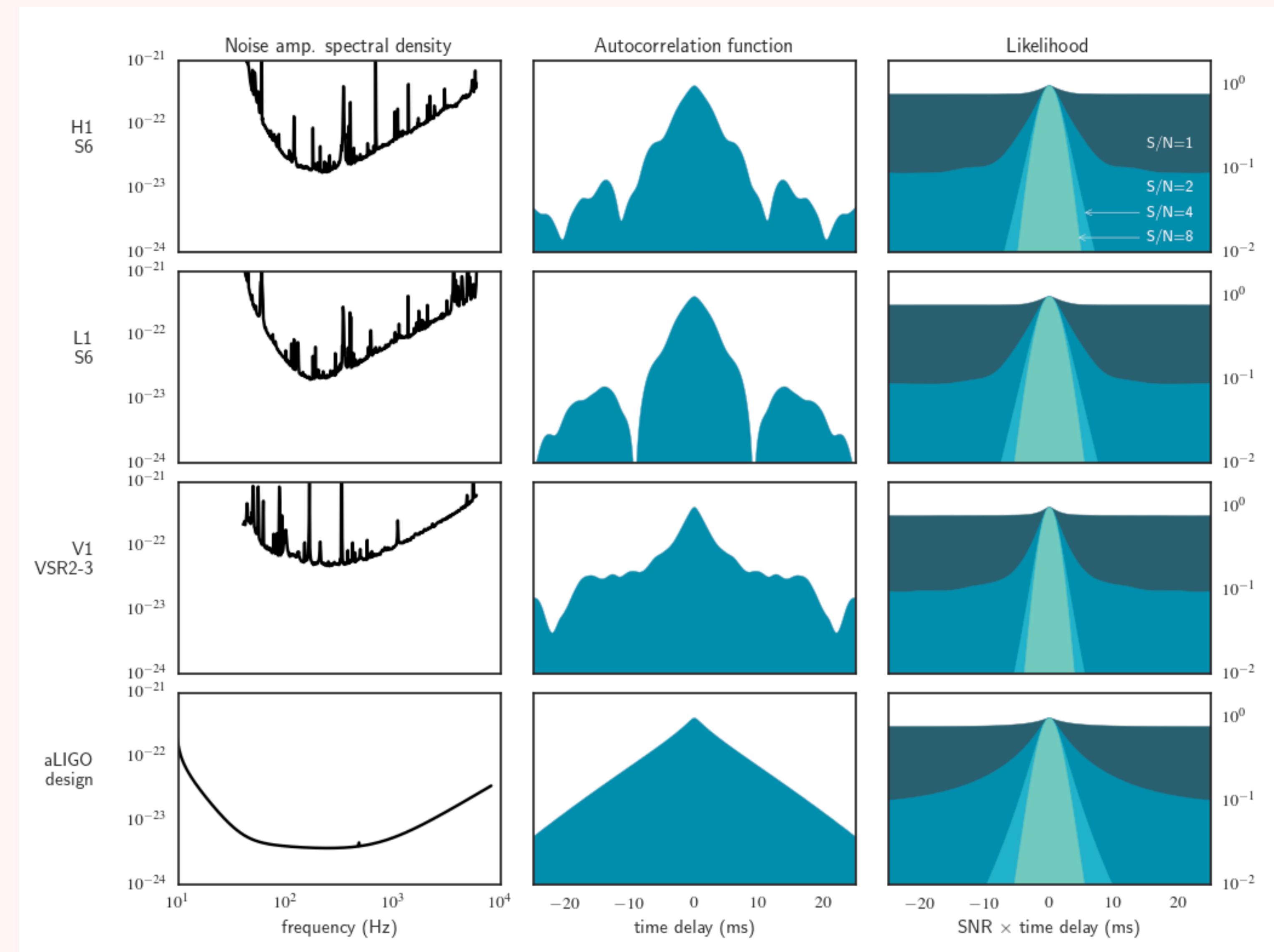
$$p(\hat{\rho}_i, \hat{\gamma}_i, \hat{\tau}_i | \rho_i, \gamma_i, \tau_i) \propto \exp\left[-\frac{1}{2} \sum_i \hat{\rho}_i^2 - \frac{1}{2} \sum_i \rho_i^2 + \sum_i \hat{\rho}_i \rho_i \mathcal{R}\{e^{i\tilde{\gamma}_i} a_i^*(\tilde{\tau}_i)\}\right]$$

Posterior for skymap

$$f(\alpha, \delta) \propto \int_0^\pi \int_{-1}^1 \int_{-T}^T \int_{r_{min}}^{r_{max}} \int_0^{1\pi} \exp\left[-\frac{1}{2} \sum_i \rho_i^2 + \sum_i \hat{\rho}_i \rho_i \mathcal{R}\{e^{i\tilde{\gamma}_i} a_i^*(\tilde{\tau}_i)\}\right] r^2 d\phi_c dr dt_a d\cos_t d\psi$$

AUTOCORRELATION FUNCTION

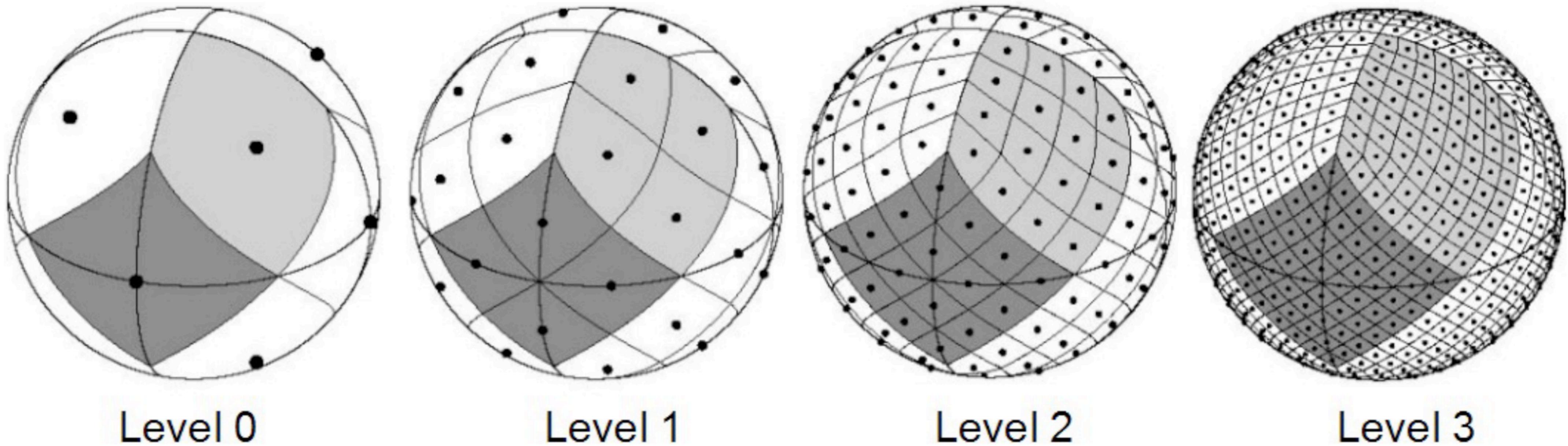
$$a_i(t; \theta_{in}) := \frac{1}{\sigma_i^2(\theta_{in})} \int_0^\infty \frac{|H(\omega; \hat{\theta}_{in})|^2}{S_i(\omega)} e^{i\omega t} d\omega$$



SETTING THE PRIORS

- $\theta_{in} = \hat{\theta}_{in}$
- *Distance : $r : 0 \sim \frac{1}{4} \max_i r_{1,i}$*
- *Inclination angle : i : uniform across all parameter space*
- *Polarization angle : ψ : uniform across all parameter space*
- *Coalescence phase : ϕ_c : uniform across all parameter space*
- *Arrival time at geocenter : t_a : $-20ms \sim 20ms$*

HEALPIX



Level 0

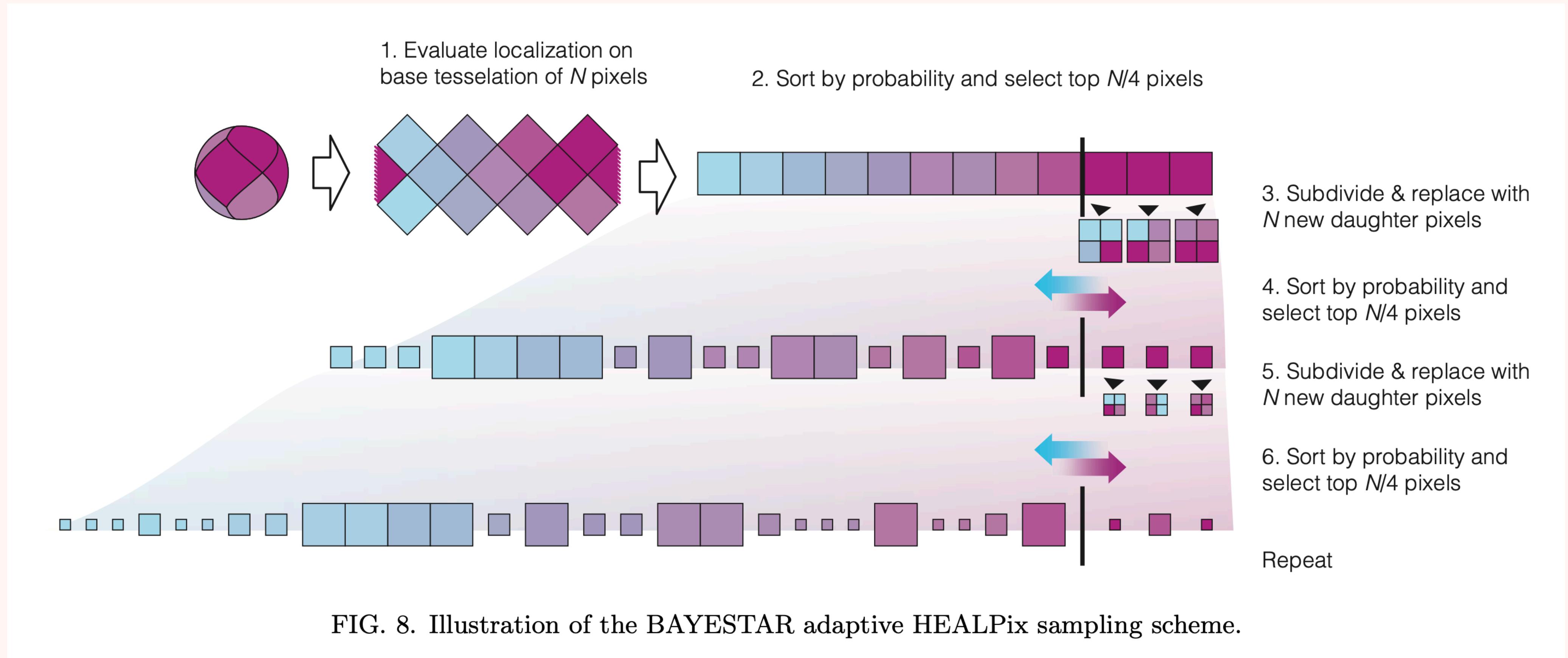
Level 1

Level 2

Level 3

<https://www.ivoa.net/documents/MOC/20190215/WD-MOC-1.1-20190215.pdf>

ADAPTIVE HEALPIX SAMPLING



<https://arxiv.org/abs/1508.03634>

RESOLUTION

- $N_{pix,0} = 3072$
- Evaluate the posterior probability density of a total of $8N_{pix,0}$ pixel
- The resolution per pixel is about 10^{-3}deg

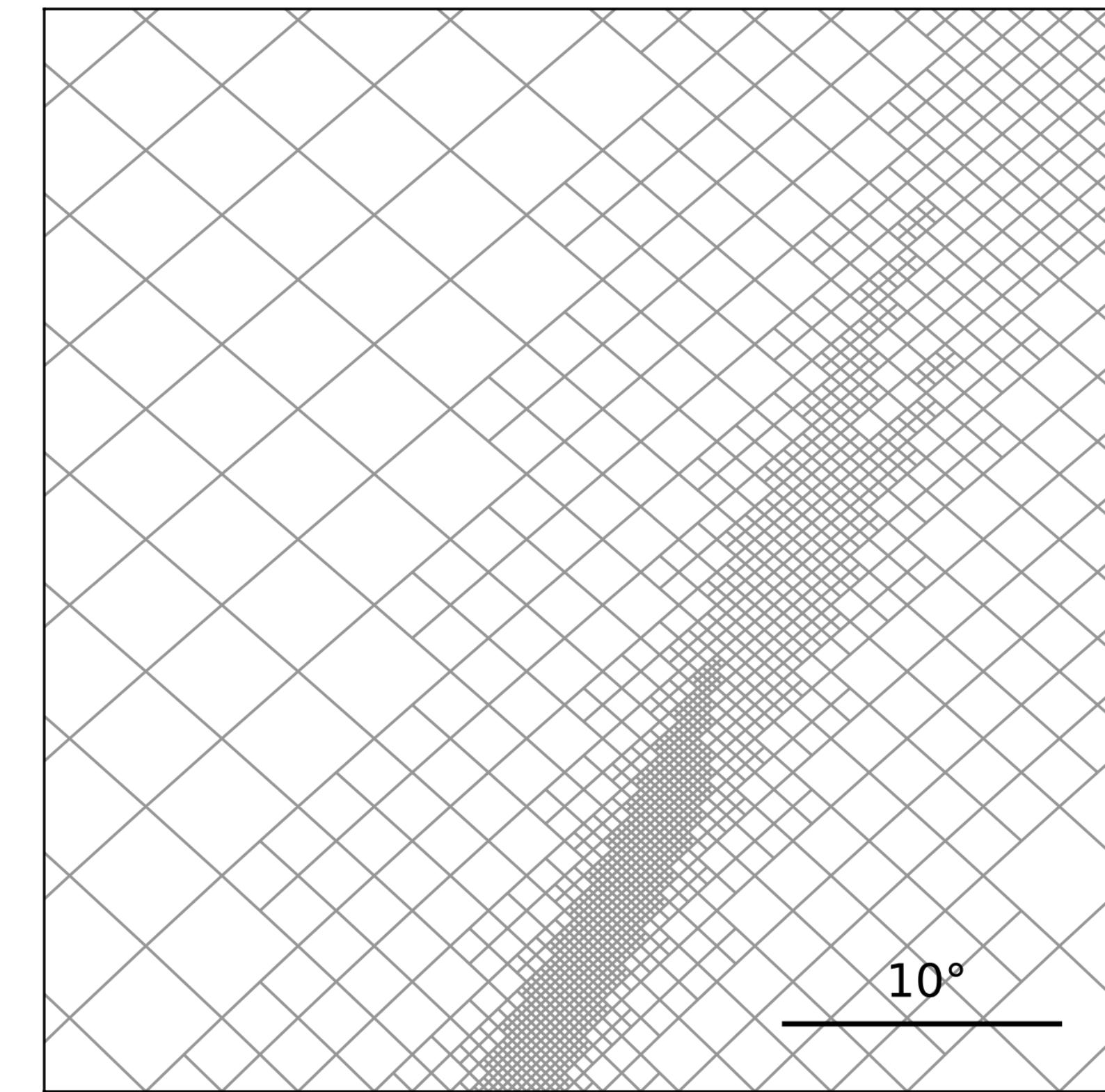


FIG. 9. An example multiresolution HEALPix mesh arising from the BAYESTAR sampling scheme (plotted in a cylindrical projection). This is event 18951 from Ref. [27].

HANDS ON

**Sky localization for GW170817 using
estimated data from**

**[https://dcc.ligo.org/LIGO-G1701985/
public](https://dcc.ligo.org/LIGO-G1701985/public)**