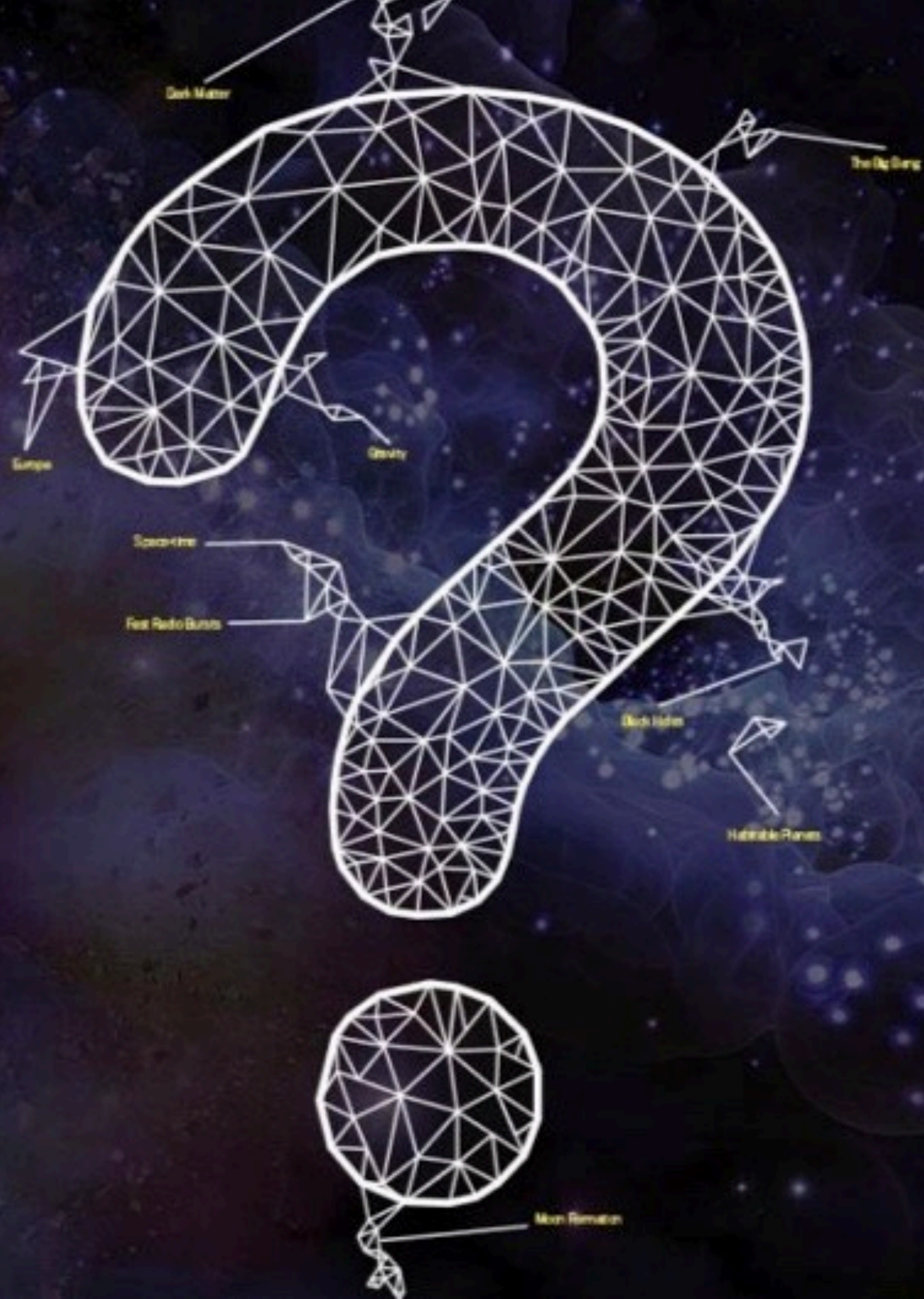


# Generic burst search



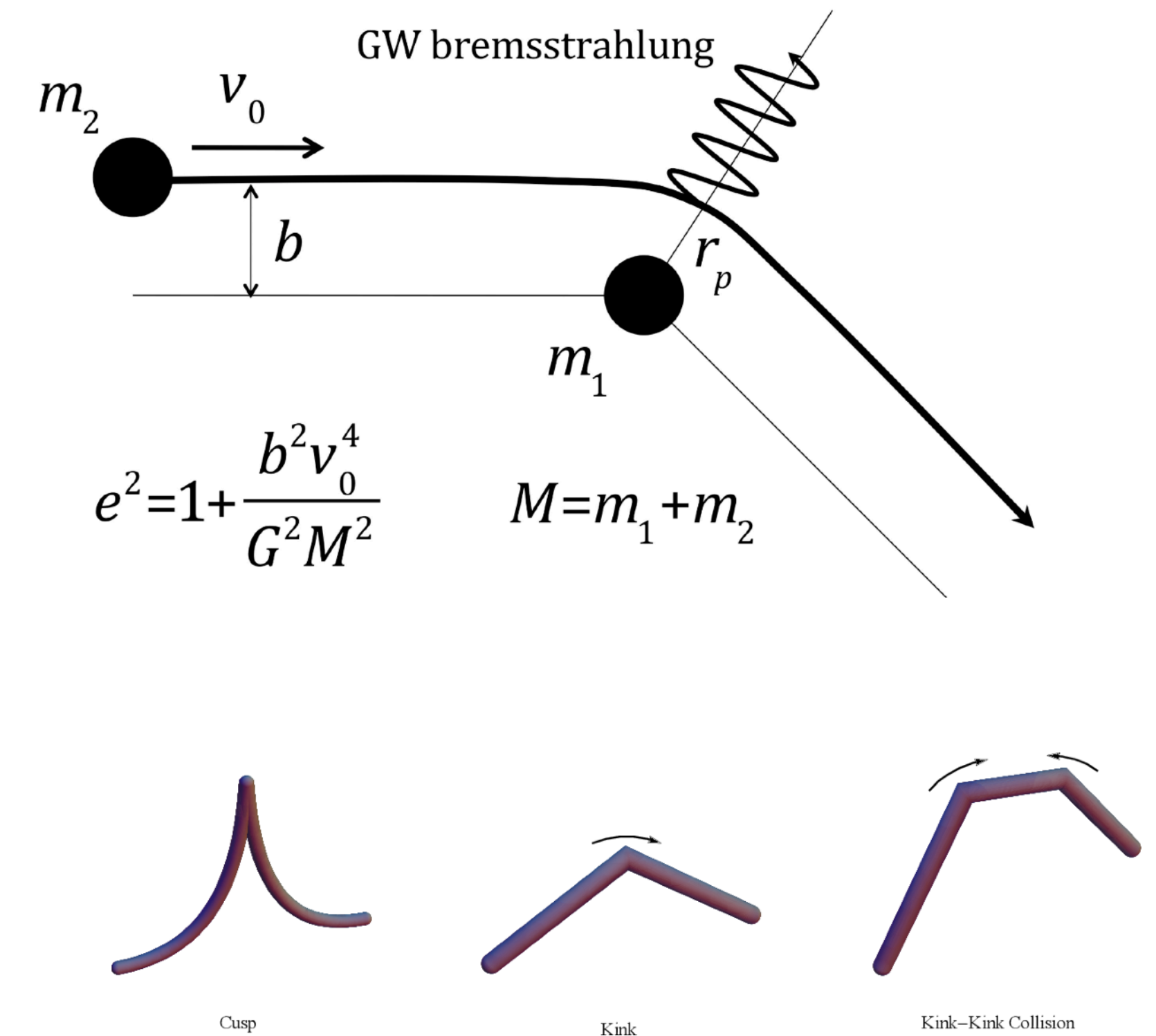
Neil Cornish

# Outline

- Motivation
- LIGO Heritage
- PTAs: Earth terms and Pulsar terms
- Wavelet Based Search
- Spline Based Search
- Piecewise Linear Search
- Status and Plans

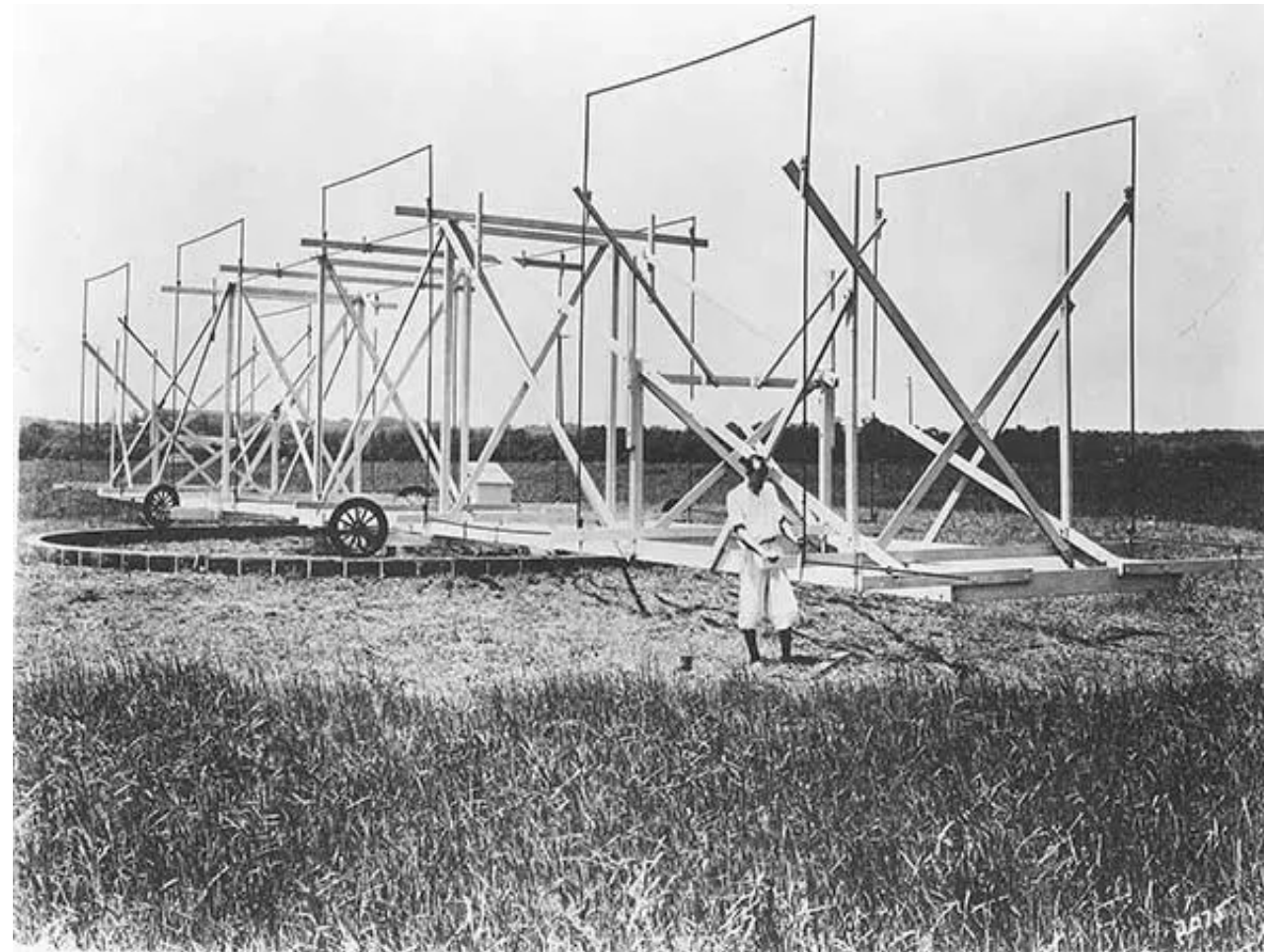
# Motivation

- Theorized burst signals
  - Hyperbolic BH encounters
  - Highly eccentric BH binaries
  - Cosmic String cusps/kinks
- Un-anticipated sources
  - Opening a new observational window

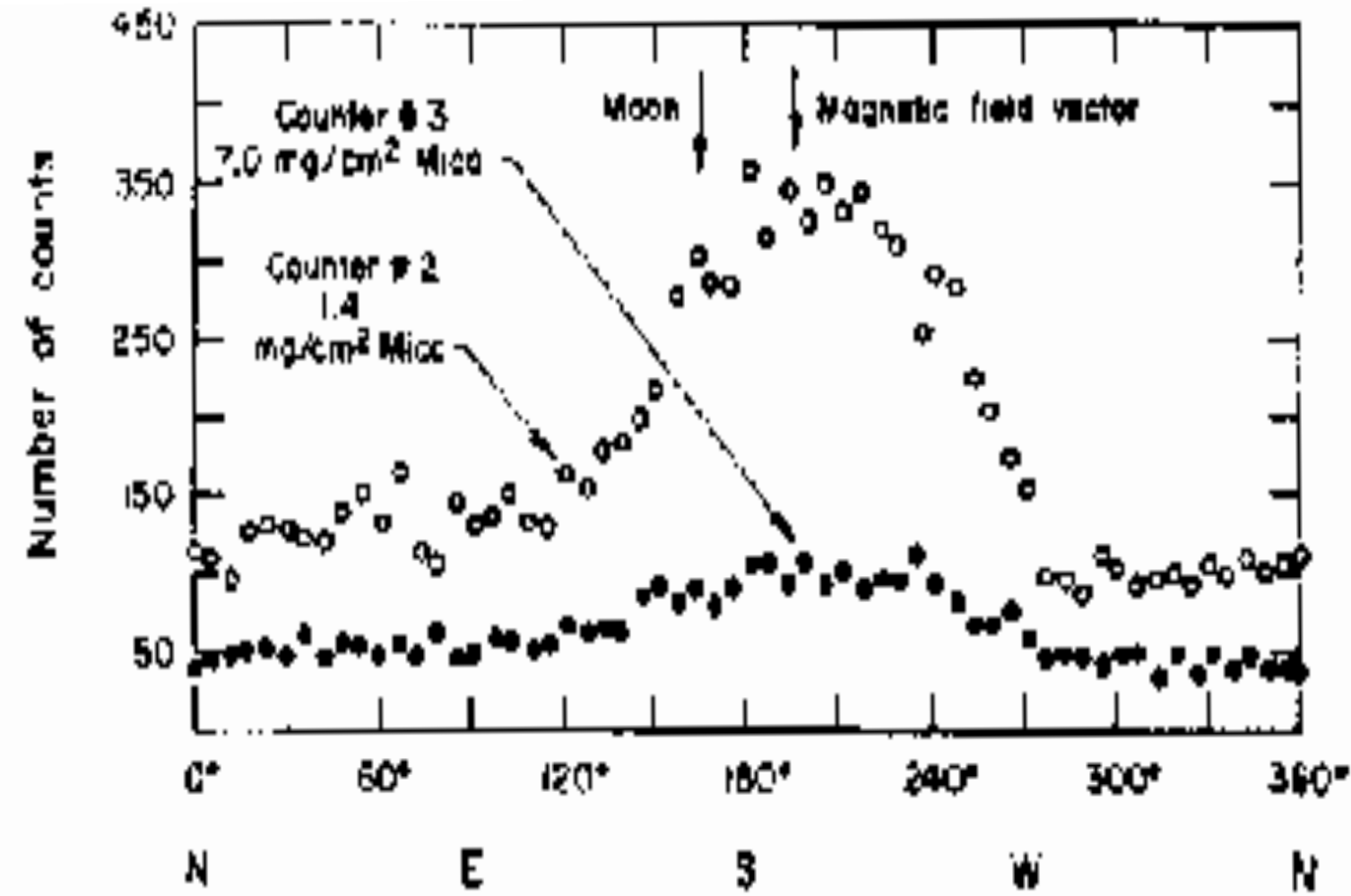


# Things that go bump in the night

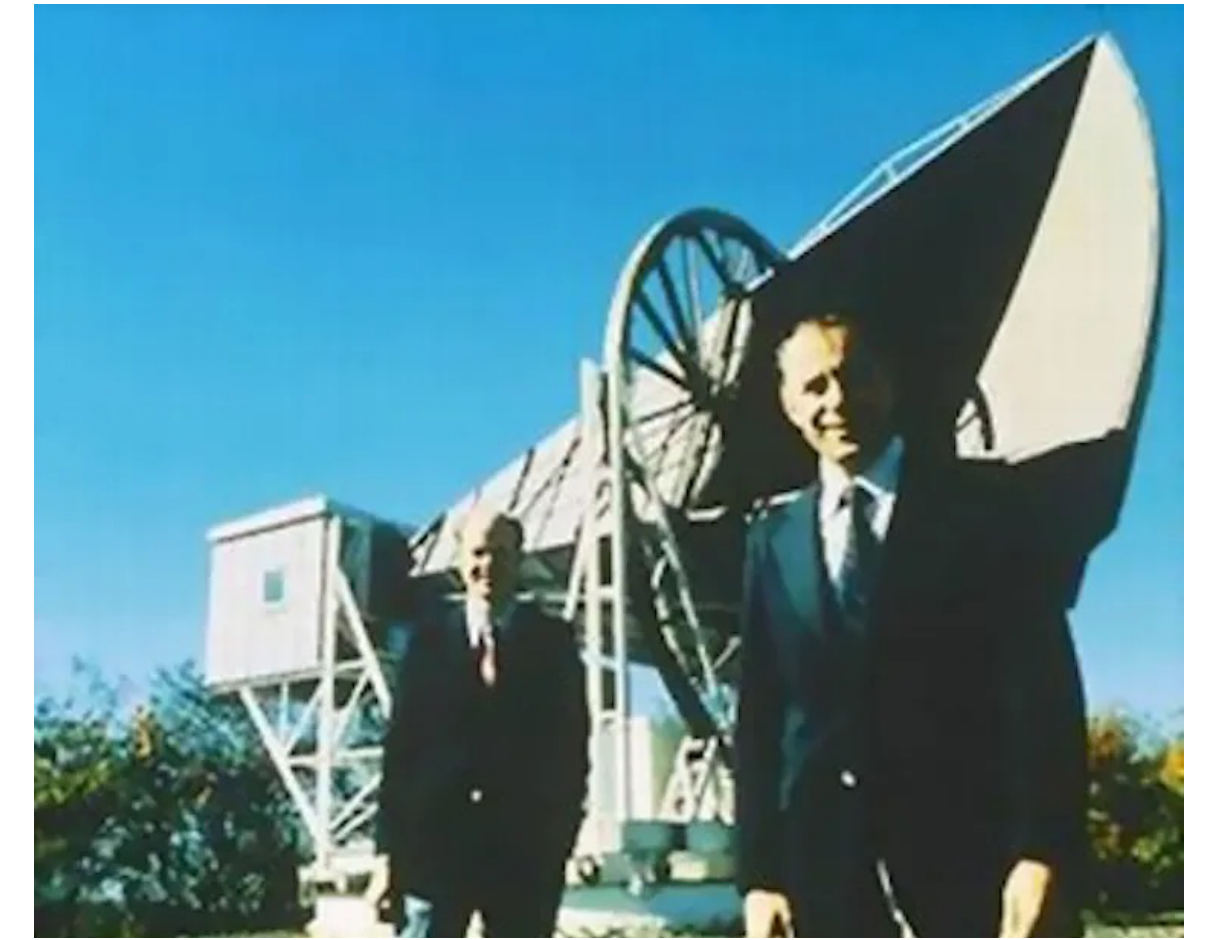
Cosmic Radio Waves 1933



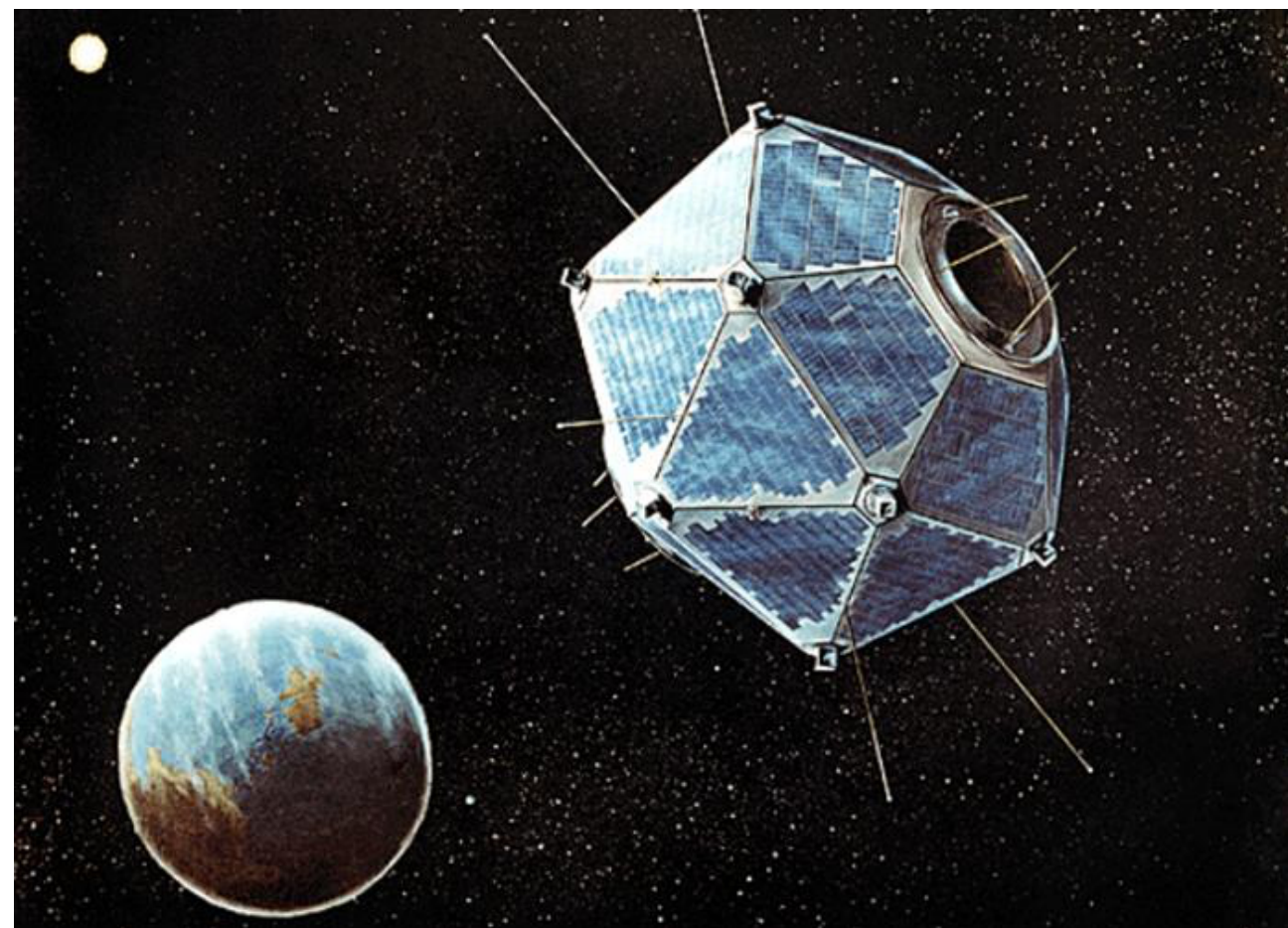
X-ray binaries 1962



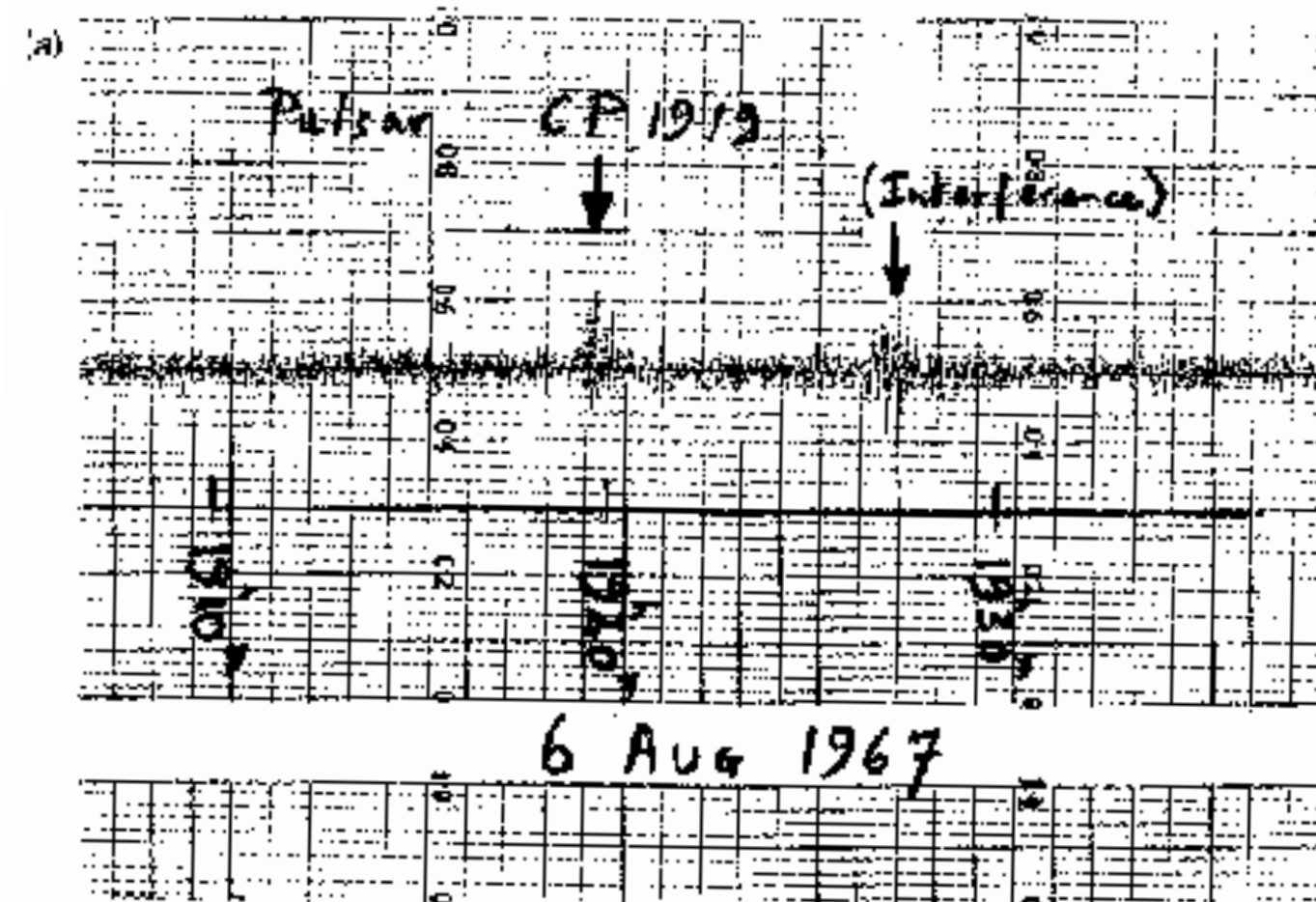
Microwave Background 1965



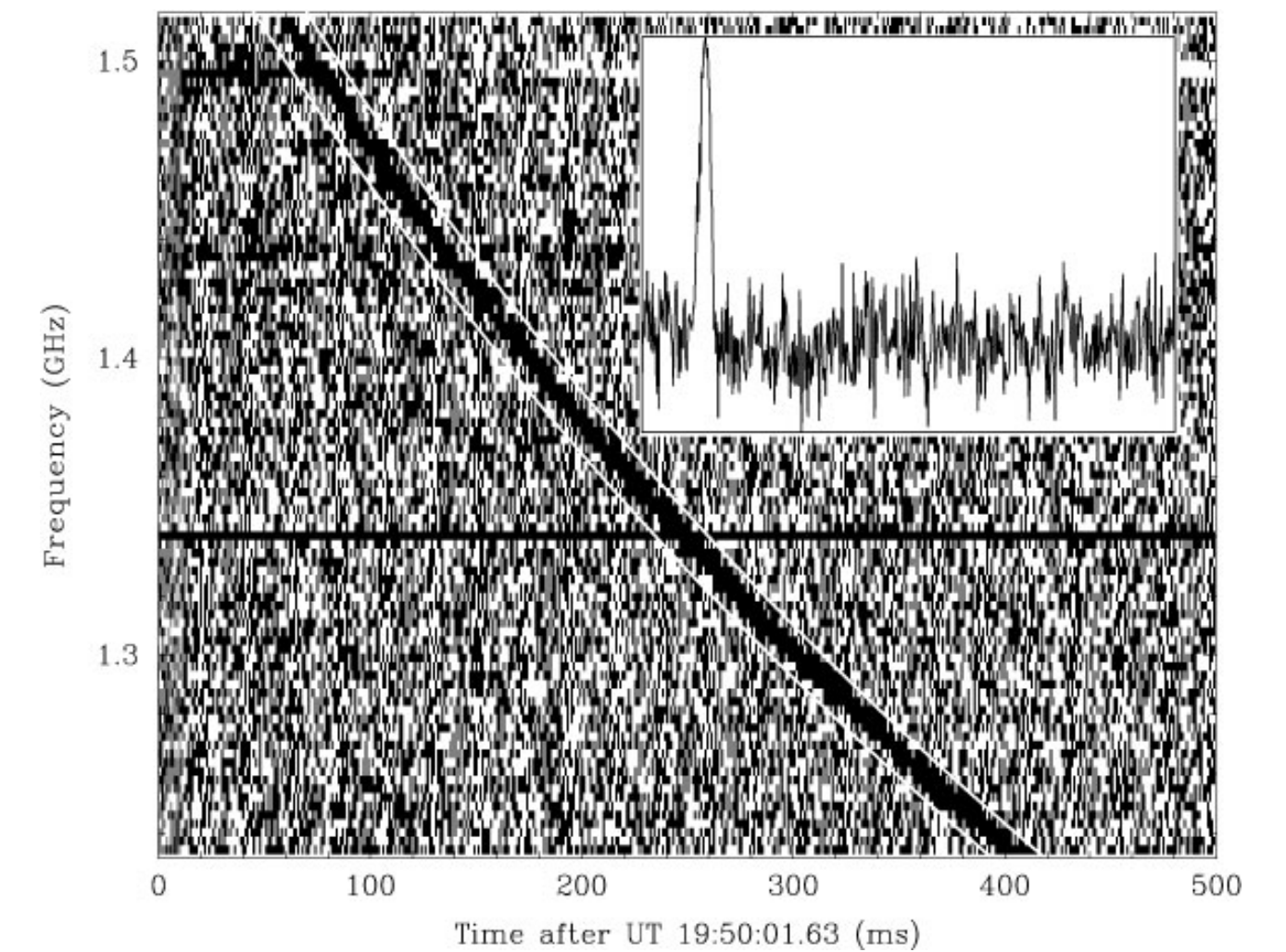
Gamma Ray Bursts 1967



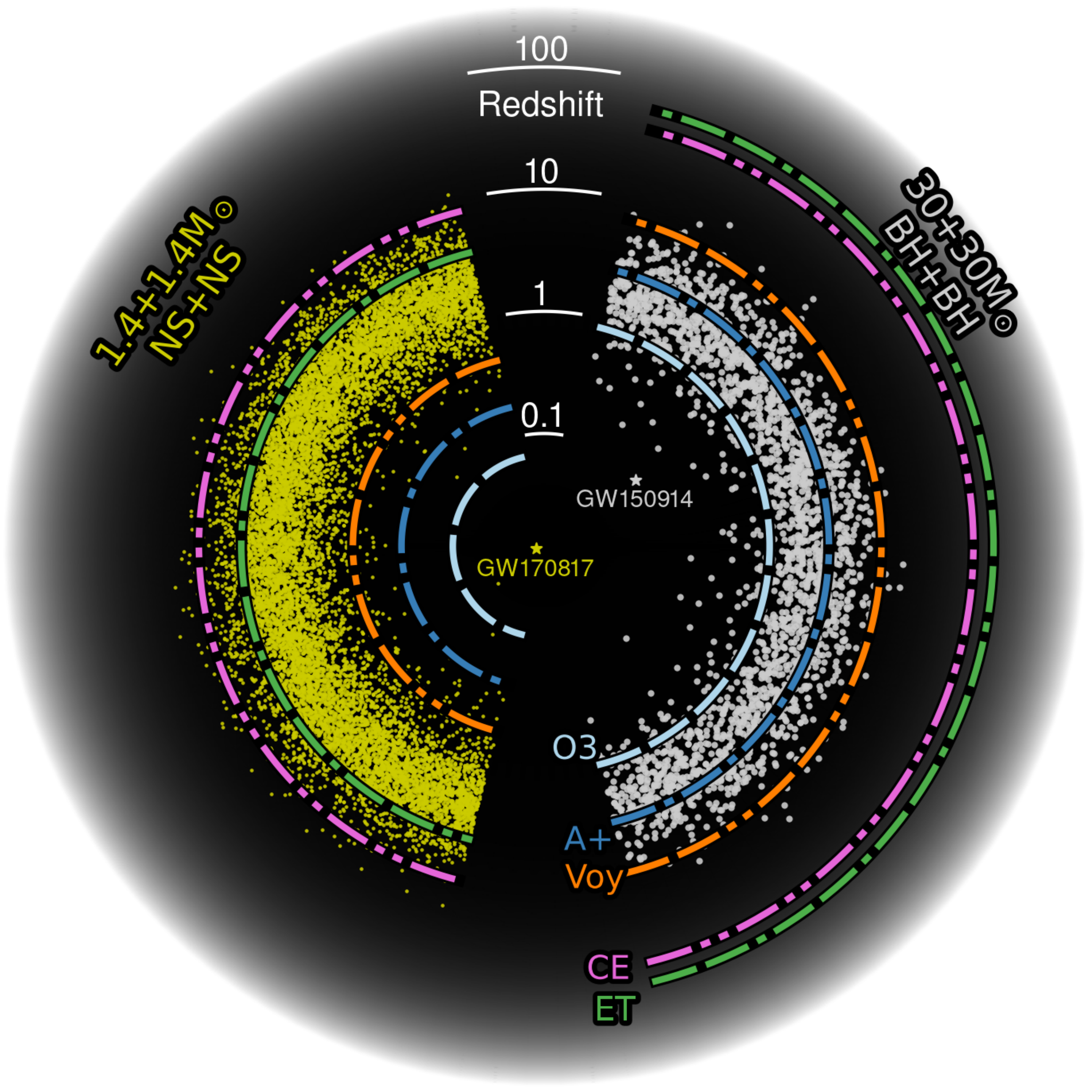
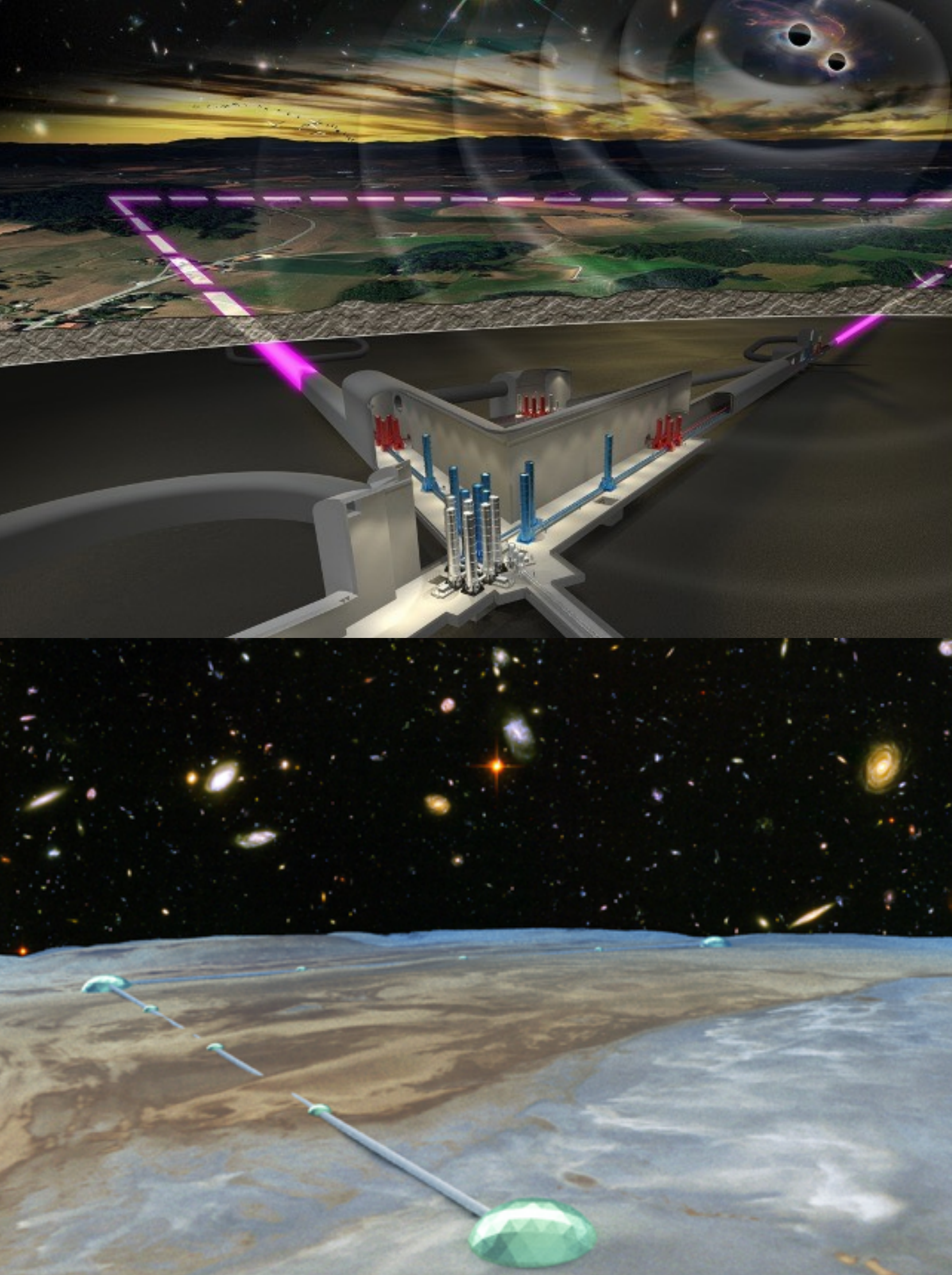
Radio Pulsars 1967



Fast Radio Bursts 2007



"Chance favours the prepared mind" Pasteur, 1854



If you don't look, you won't find it

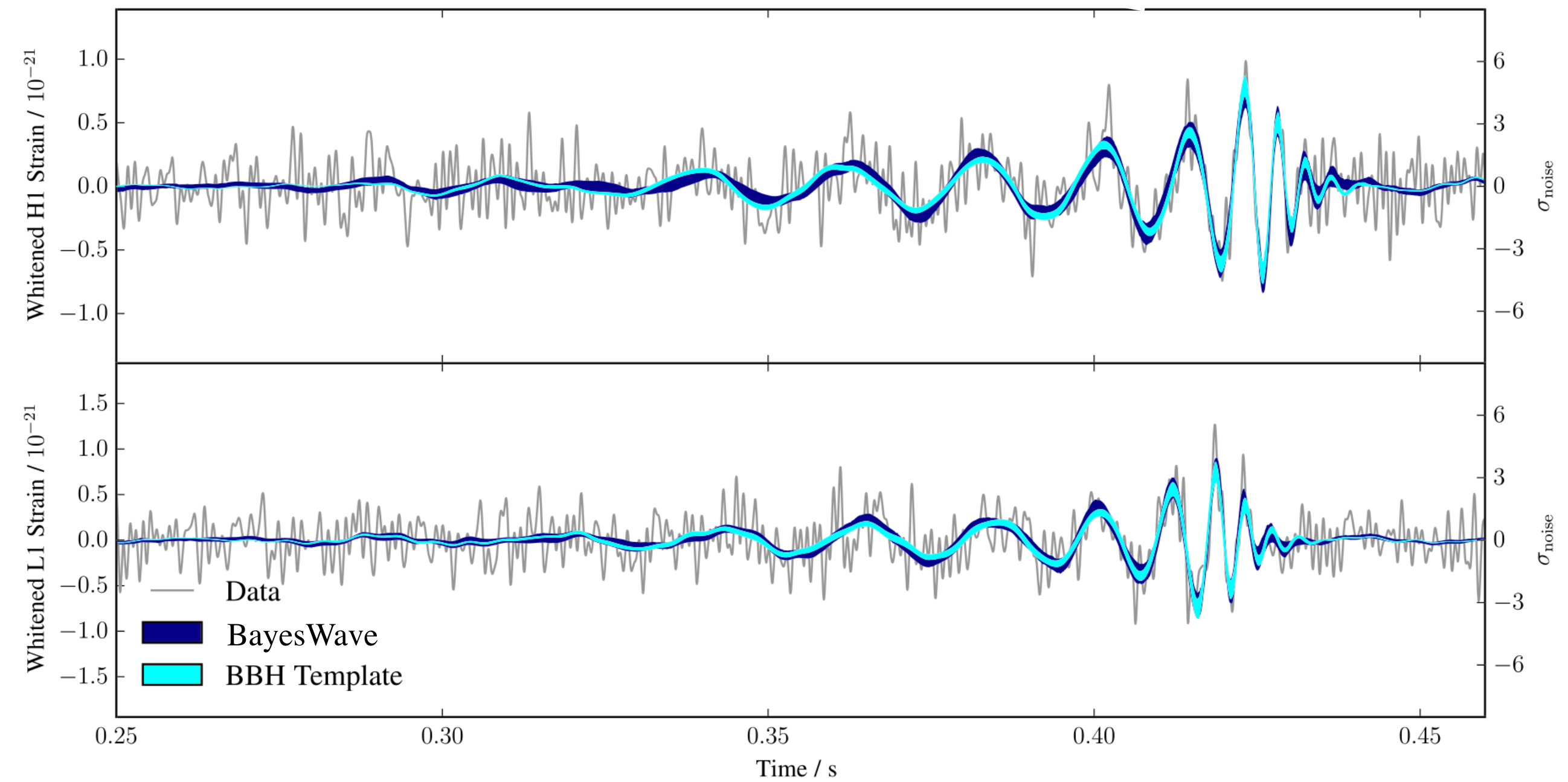
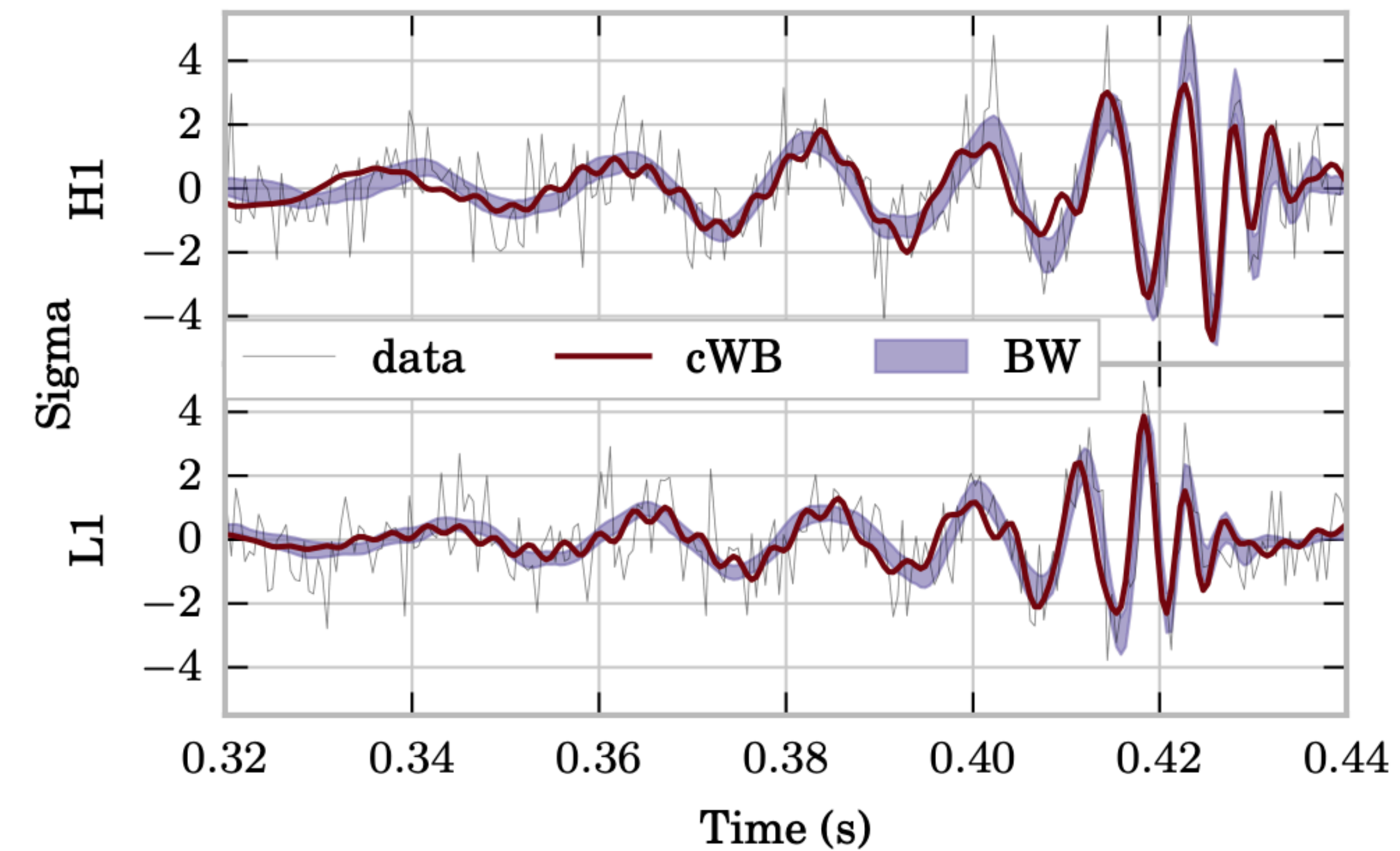
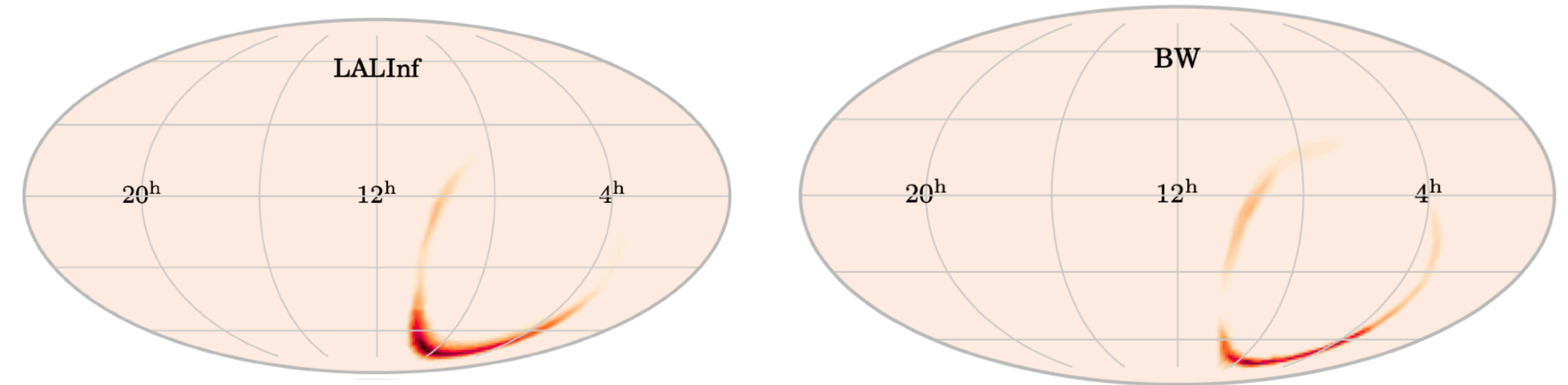
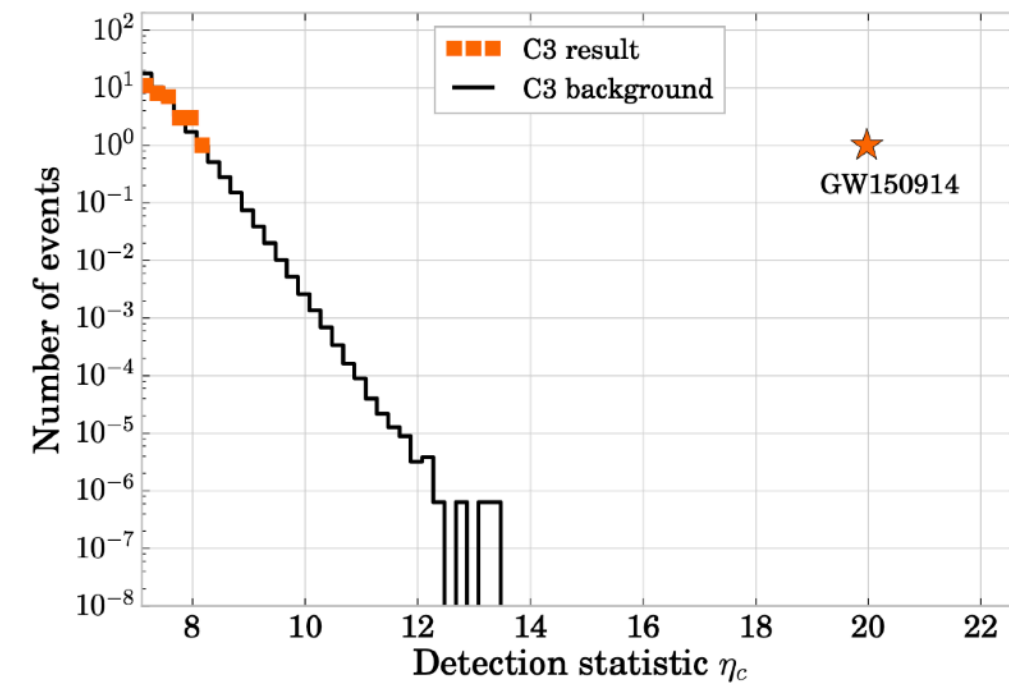
Low probability, Big reward

# Outline

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# Model Agnostic Signal Reconstruction

GW150914 first detected by generic wavelet reconstruction techniques, coherent Wave Burst and BayesWave



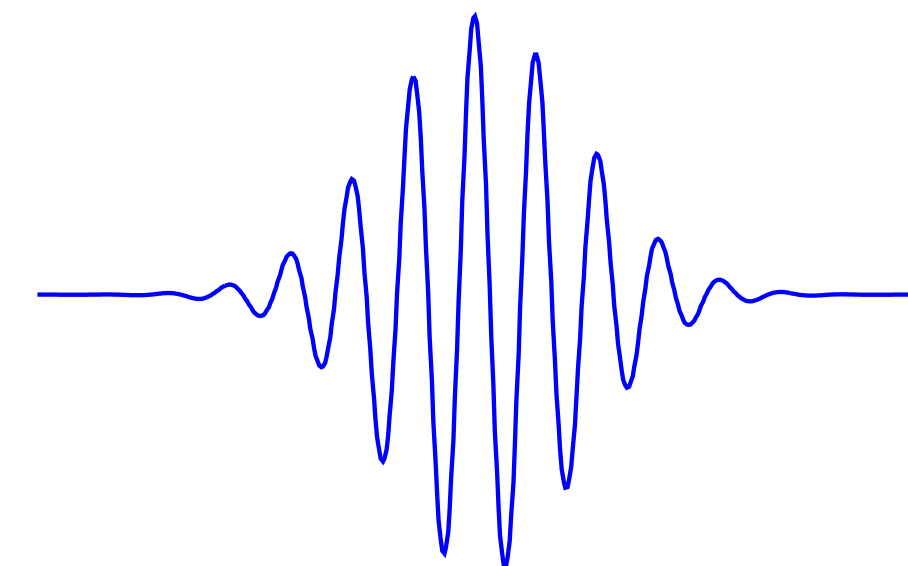


# Detection without templates

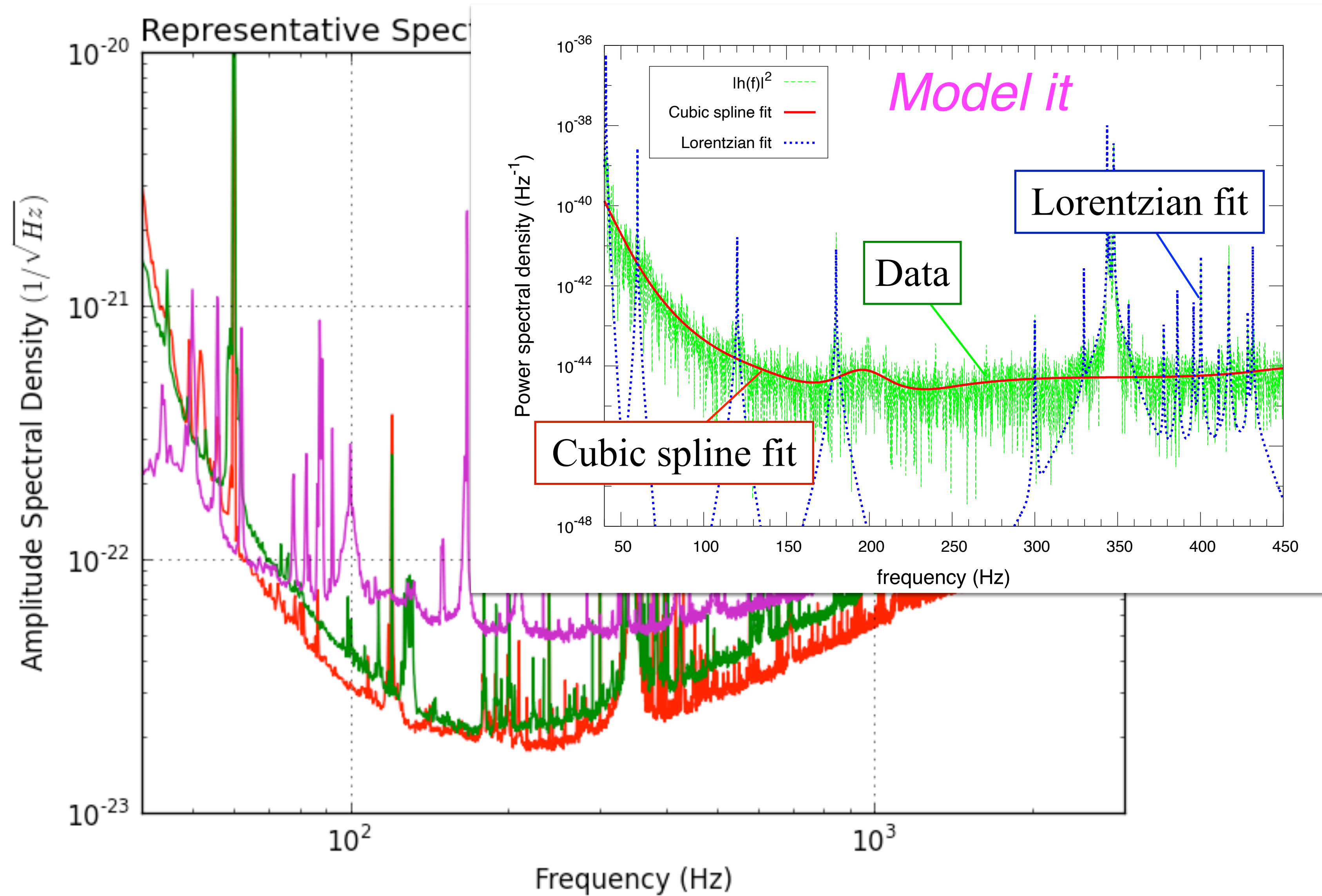
## BayesWave

- **Bayesian** model selection
  - Three part model (signal, glitches, gaussian noise)
  - Trans-dimensional Markov Chain Monte Carlo
- **Wavelet** decomposition
  - Glitch & GW modeled by wavelets
  - Number, amplitude, quality and TF location of wavelets varies

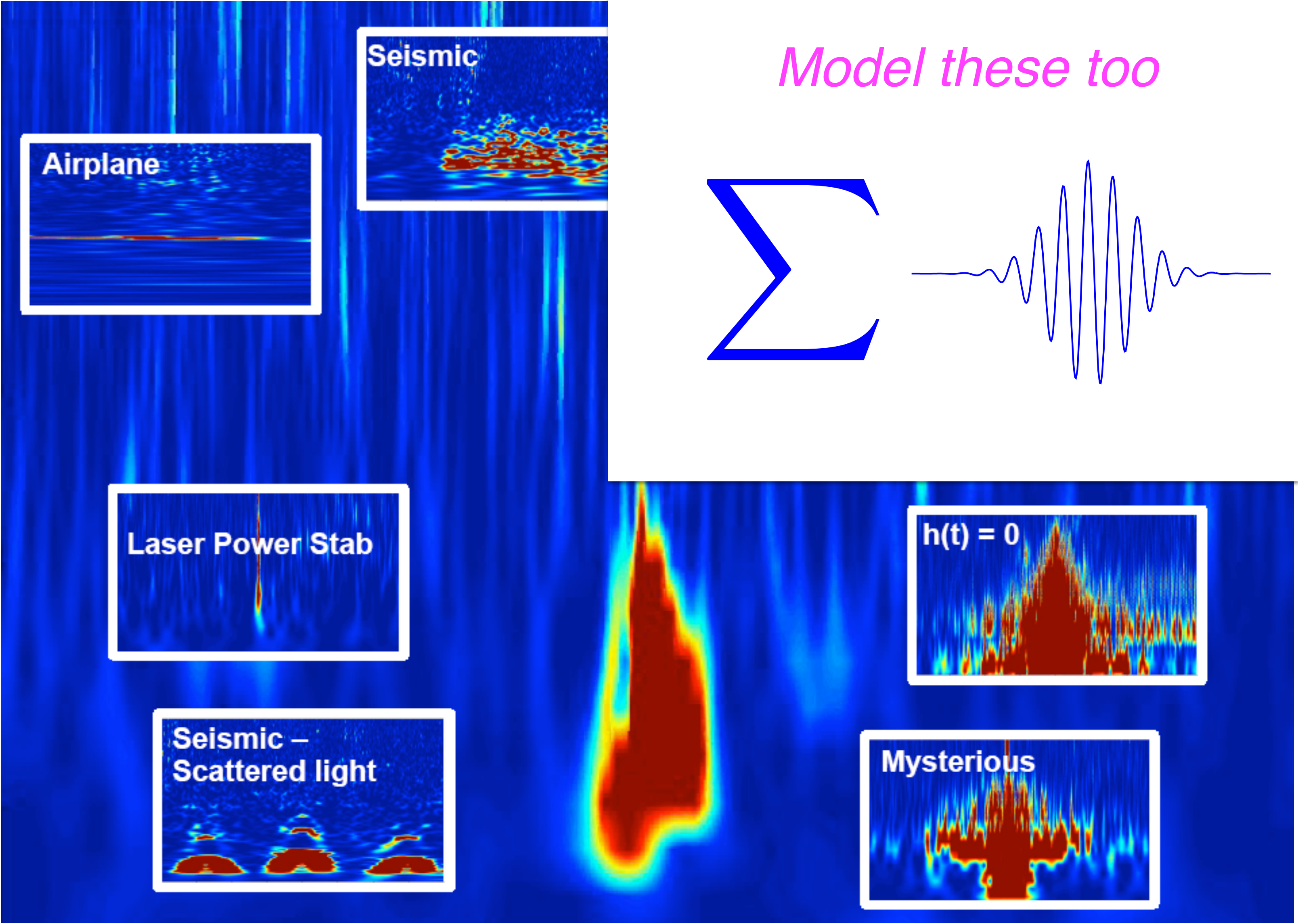
Continuous Morlet/Gabor Wavelets



# Lines and a drifting noise floor

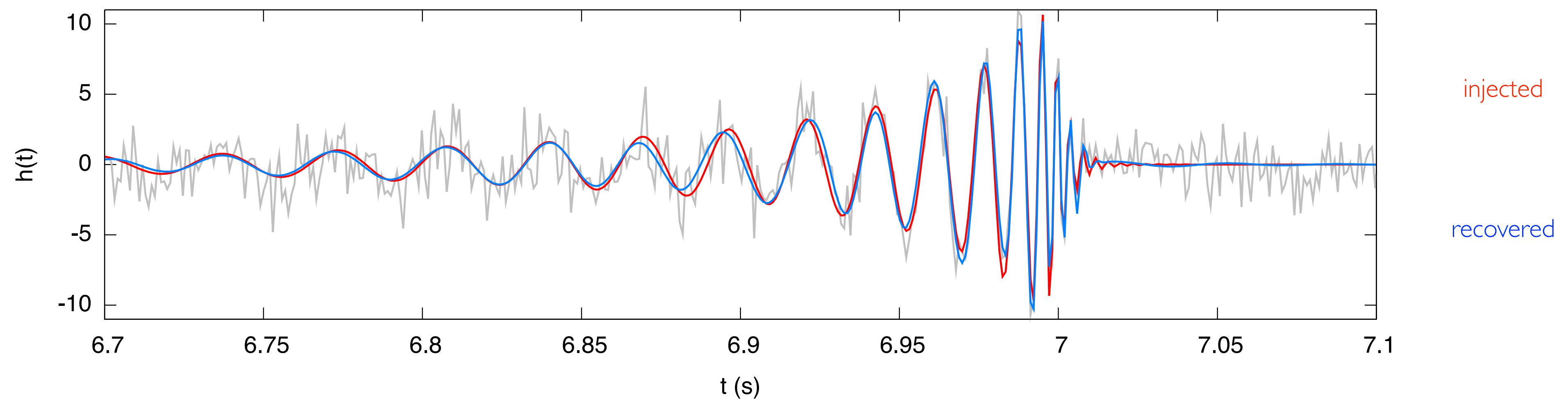
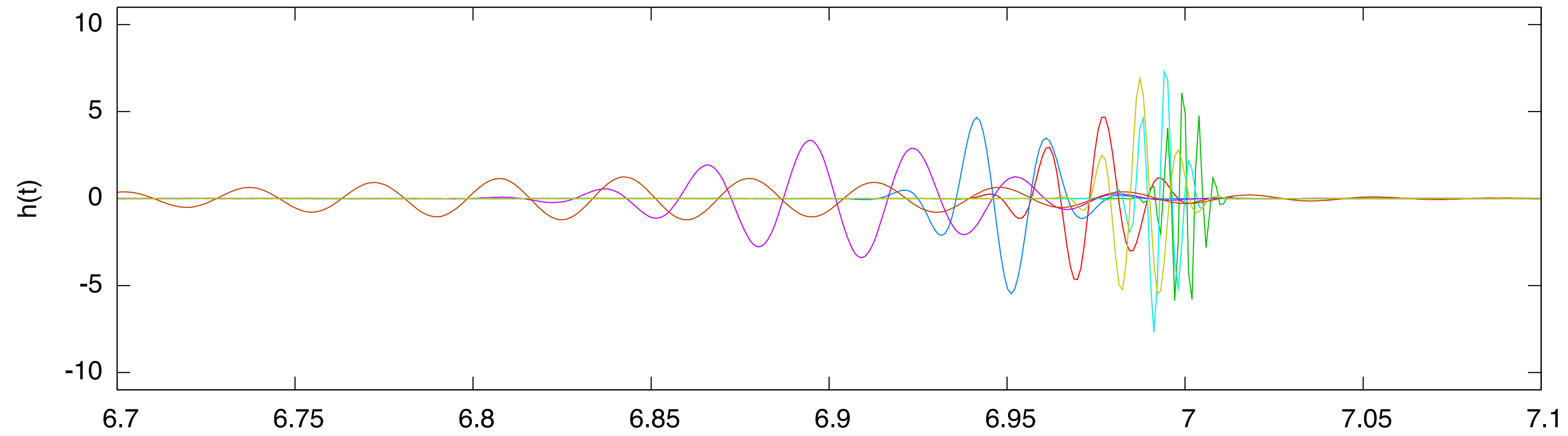
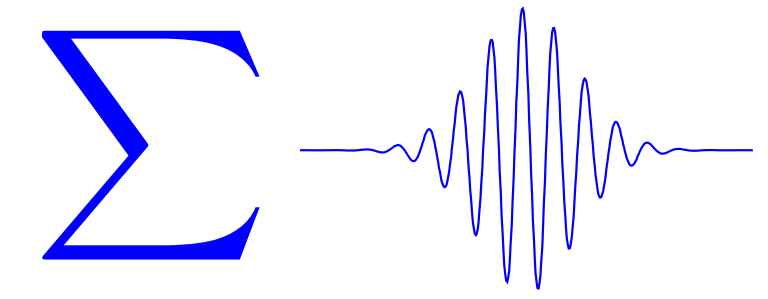


# Glitches

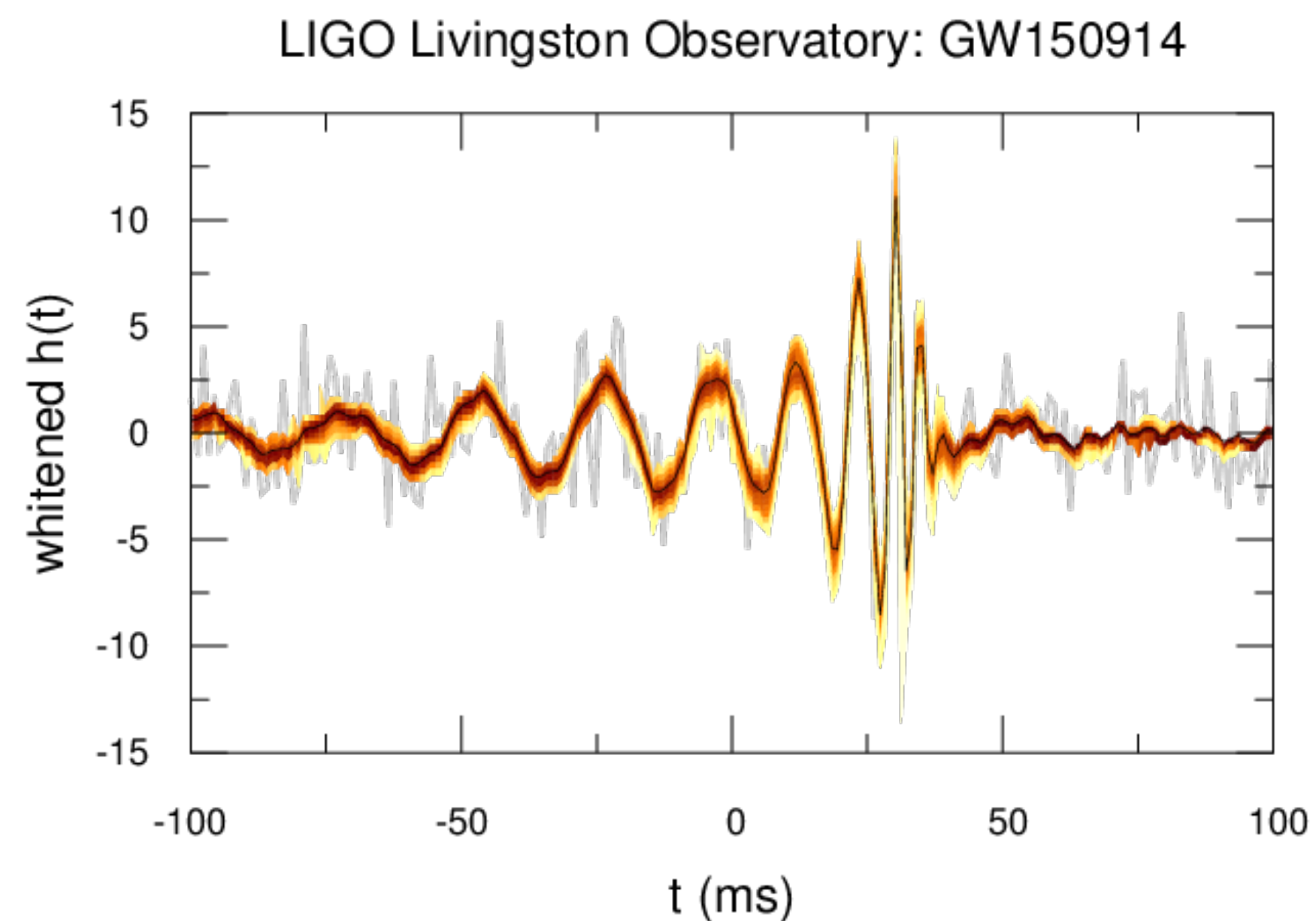
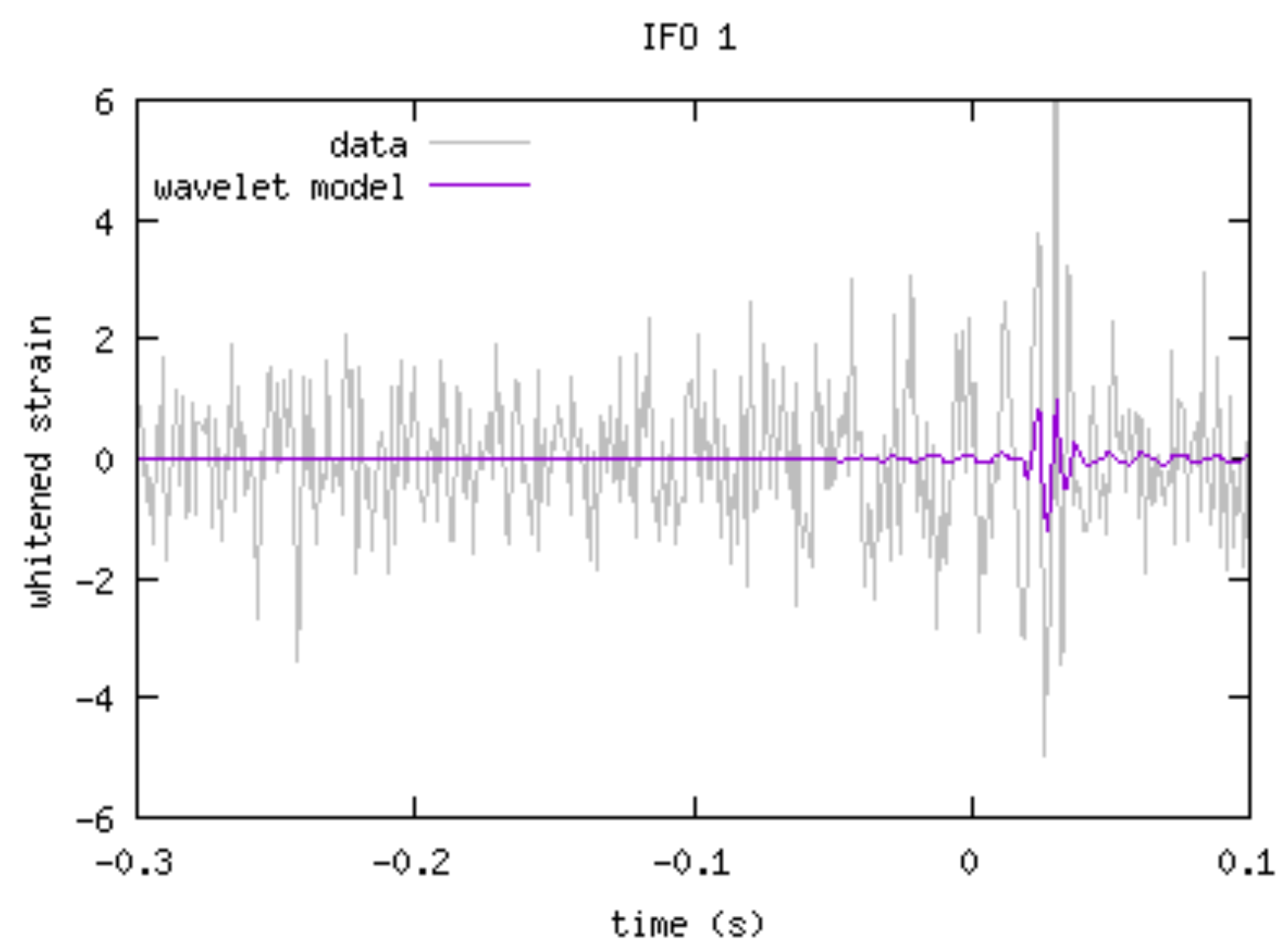
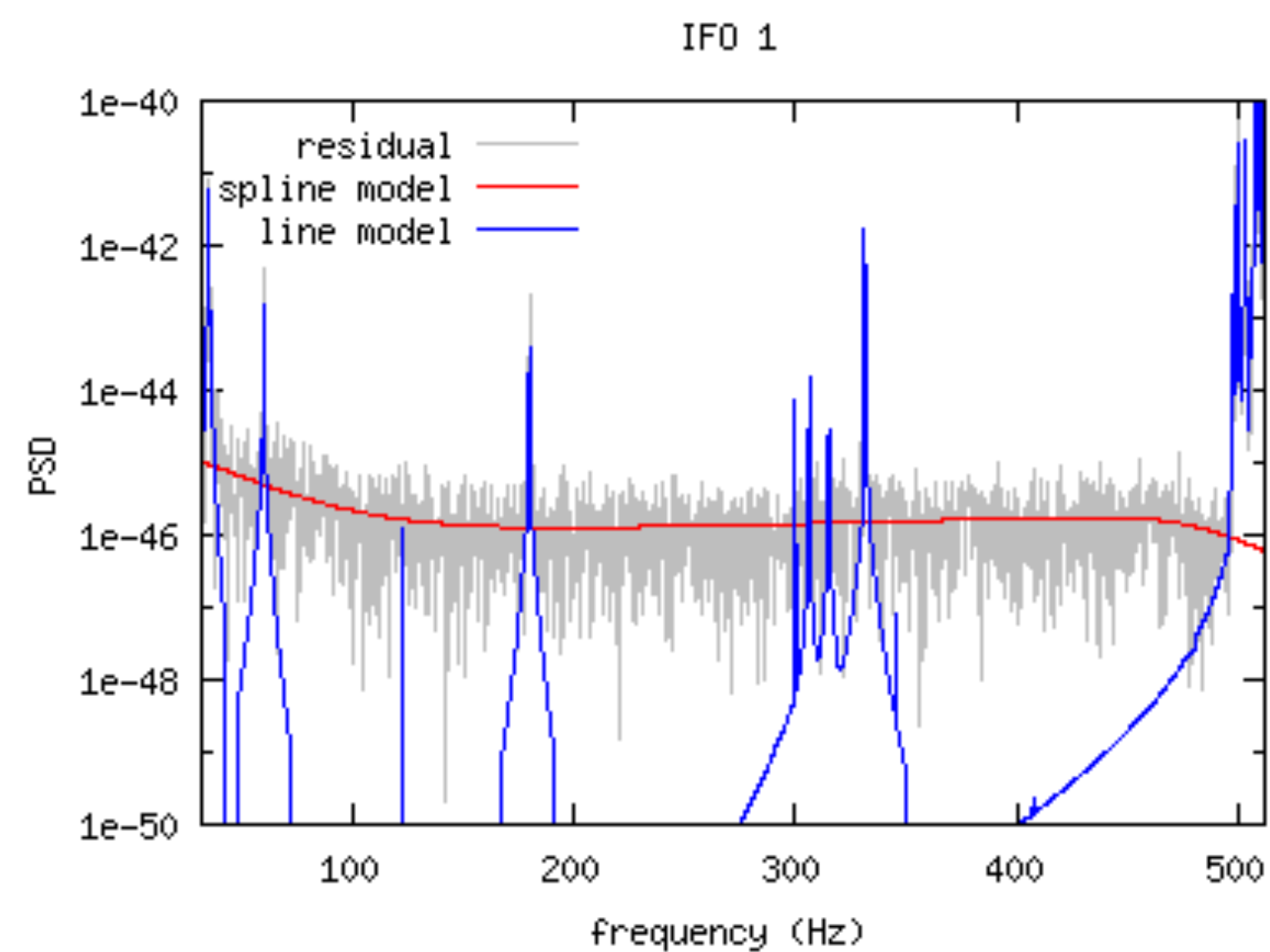
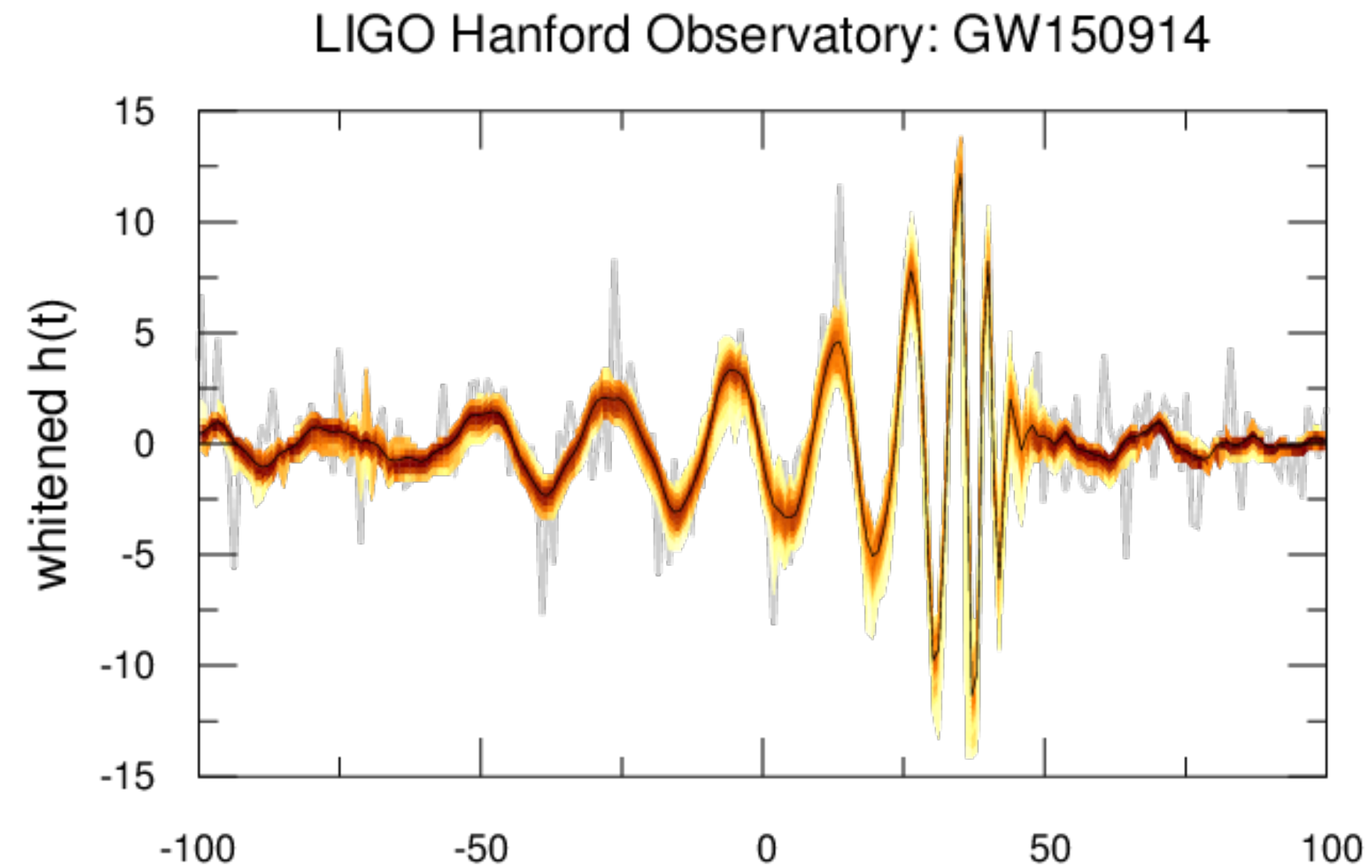
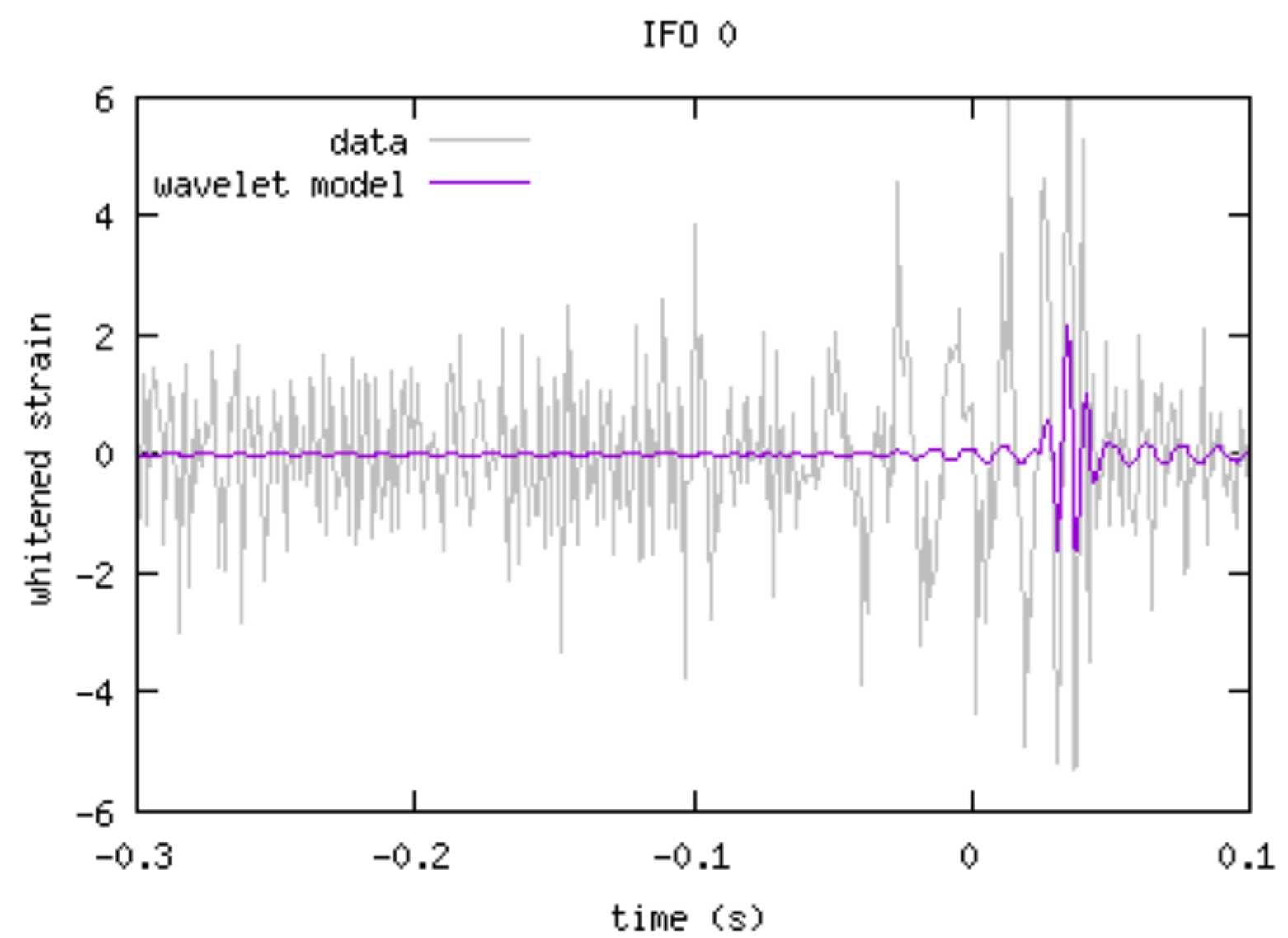
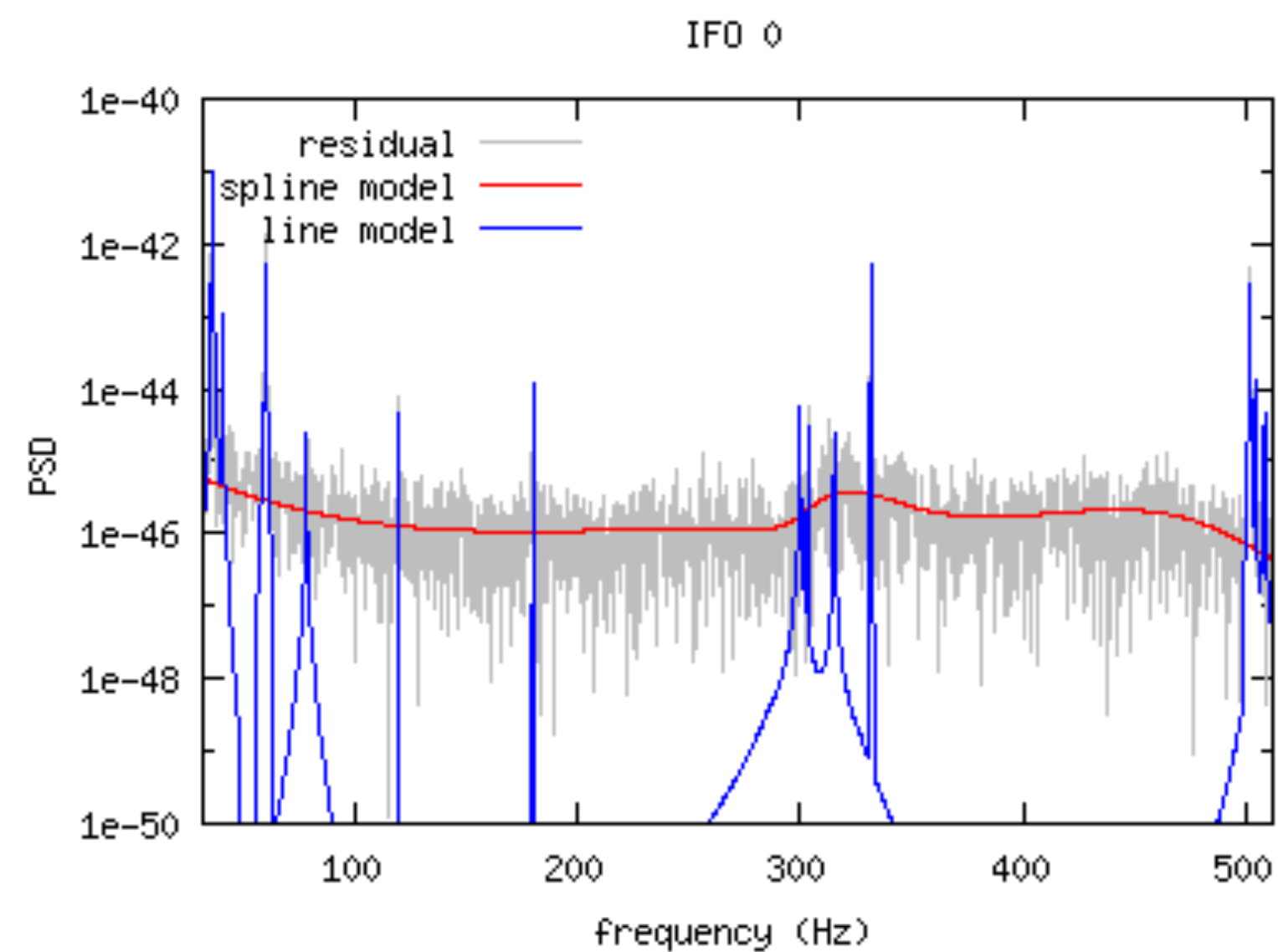


# Gravitational Waves

*Model these too*



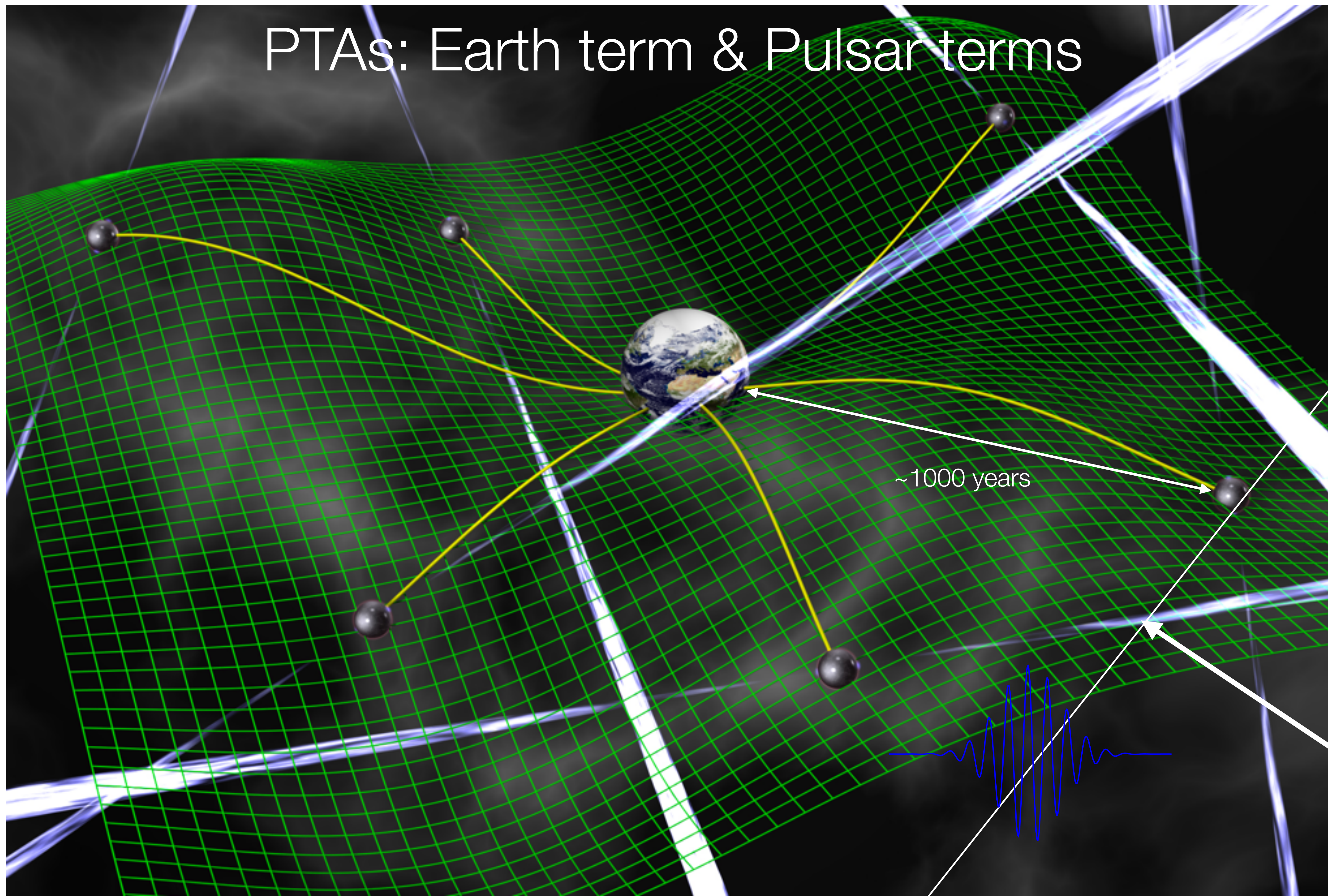
# Reconstructing GW150914 with wavelets



# Outline

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# PTAs: Earth term & Pulsar terms



# PTAs: Earth term & Pulsar terms

$$T_{\text{burst}} \leq T_{\text{obs}}$$

We define bursts are being short duration compared to our data span - months to years

For a given burst, will either detect the Earth term or the pulsar term in one pulsar

$$S/N_{\text{Earth}} \simeq \sqrt{N_p} S/N_{\text{pulsar}} \quad \Rightarrow \quad V_{\text{Earth}} = N_p^{3/2} V_{\text{pulsar}}$$

$$T_{\text{pulsar}} \simeq N_p T_{\text{obs}}$$

$$\Rightarrow \text{Detections}_{\text{Earth}} \simeq \sqrt{N_p} \text{Detections}_{\text{pulsar}}$$

But, difficult to say if pulsar term bursts are signals or noise transients



# Outline

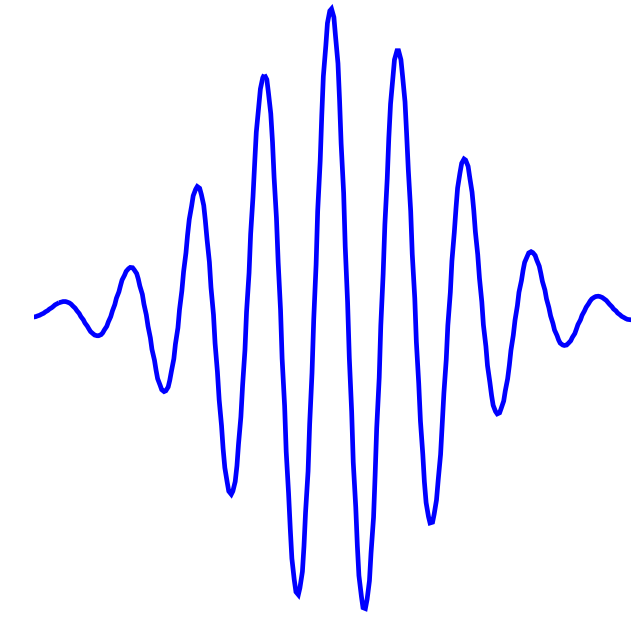
- Motivation
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# BayesWave for PTAs

[Ellis & Cornish arXiv 1601.00650]

[Becsy & Cornish arXiv 2011.01942]

$$H_+(t) = \sum_{i=0}^N \Psi(t, t_i, f_i, \tau_i, A_+, \phi_+)$$



$$H_\times(t) = \sum_{i=0}^N \Psi(t, t_i, f_i, \tau_i, A_\times, \phi_\times)$$

$$\Psi(t, t_i, f_i, \tau, A, \phi) = A e^{(t-t_i)^2/\tau^2} \cos(2\pi f_i(t - t_i) + \phi)$$

No pulsar term. Also have noise transient model in each pulsar.  
Same form as signal model but not correlated across the array.

Can also have elliptically polarized model with  $A_\times = \epsilon A_+$ ,  $\phi_\times = \phi_+ + \pi/2$ .

Can use shape/projection decomposition and pre-computed inner products to speed up the likelihoods

# Continuous wavelets, unevenly sampled data

Similar to how we model the stochastic background

$$\mathbf{h} = \mathbf{aF}$$

$$a_n^c \cos(2\pi nt/T) + a_n^s \sin(2\pi nt/T)$$

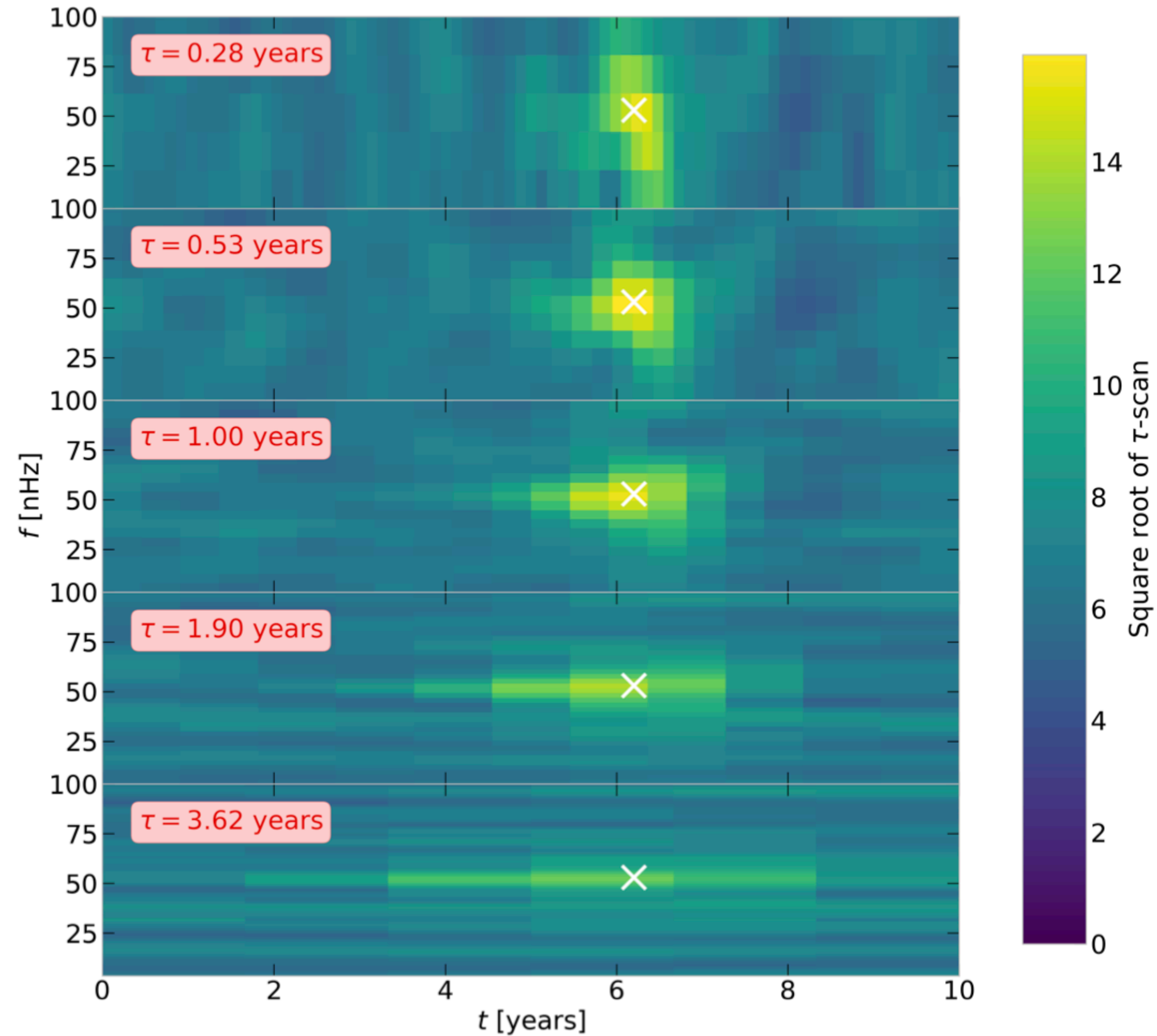
$$p(\mathbf{d} | \mathbf{a}) = \frac{1}{\det(2\pi\mathbf{C})^{1/2}} \exp\left(-\frac{1}{2}(\mathbf{d} - \mathbf{aF})^T \mathbf{C}^{-1}(\mathbf{d} - \mathbf{aF})\right) \quad p(\mathbf{a}) = \frac{1}{\det(2\pi\boldsymbol{\phi})^{1/2}} \exp\left(-\frac{1}{2}\mathbf{a}^T \boldsymbol{\phi}^{-1}\mathbf{a}\right)$$

Integrate out the Fourier amplitudes  $\mathbf{a}$

$$p(\mathbf{d} | \mathbf{S}_h) = \frac{1}{\det(2\pi\tilde{\mathbf{C}})^{1/2}} \exp\left(-\frac{1}{2}\mathbf{d} \tilde{\mathbf{C}}^{-1} \mathbf{d}\right) \quad \mathbf{C}^{-1} \rightarrow \tilde{\mathbf{C}}^{-1} = \mathbf{F}^T \mathbf{C}^{-1} \mathbf{F} + \boldsymbol{\phi}^{-1}$$

# BayesWave for PTAs

[Becsy & Cornish arXiv 2011.01942]

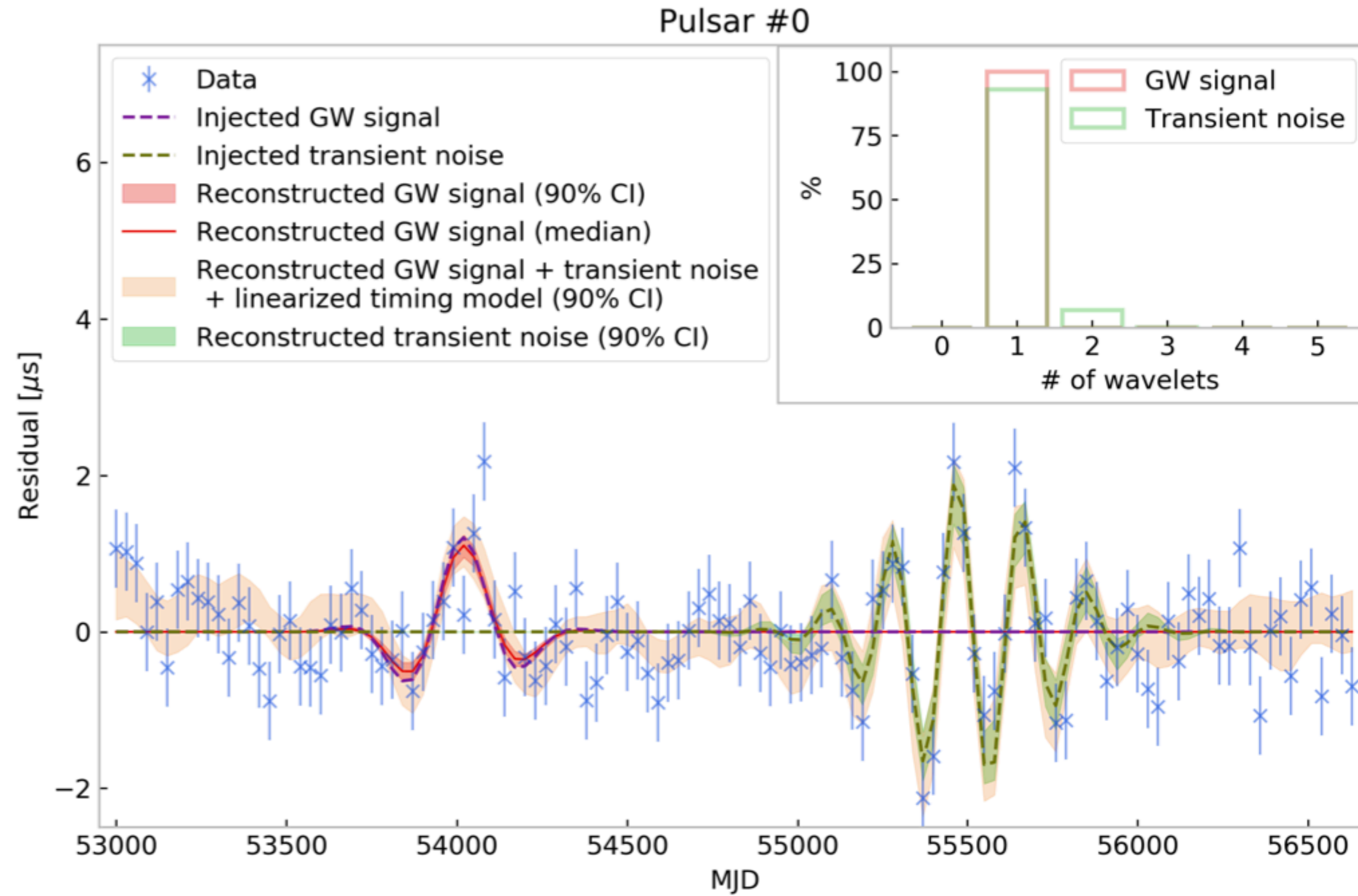


$$P(t, f) = (d | \Psi(t, f, \tau))^2$$

Use a variety of proposals, including tau-scans of the data in each pulsar. Shown is a tau scan of a simulated white noise burst

# BayesWave for PTAs

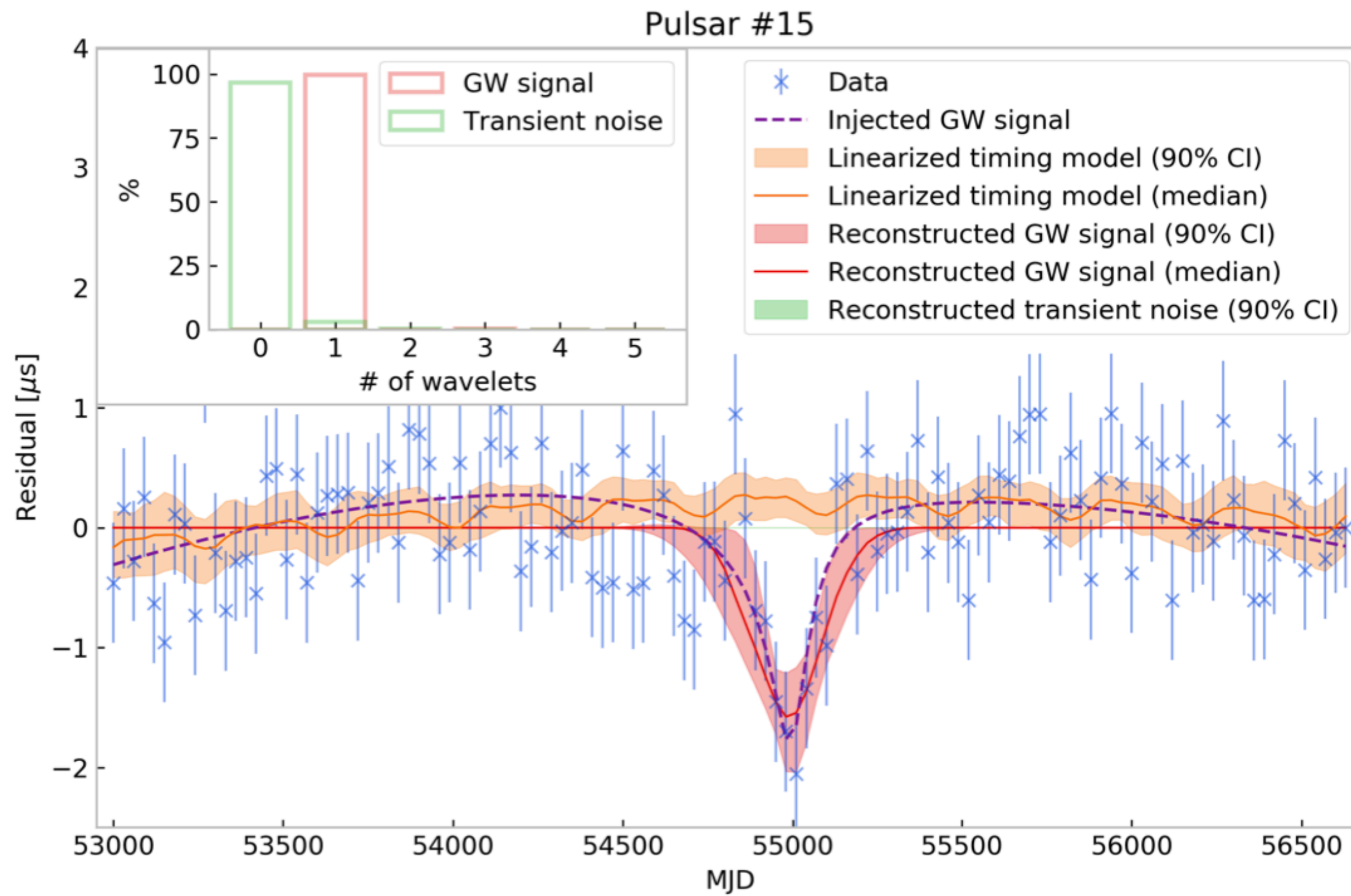
[Becsy & Cornish arXiv 2011.01942]



Example where we are able to detect a signal and a noise transient simultaneously

# BayesWave for PTAs

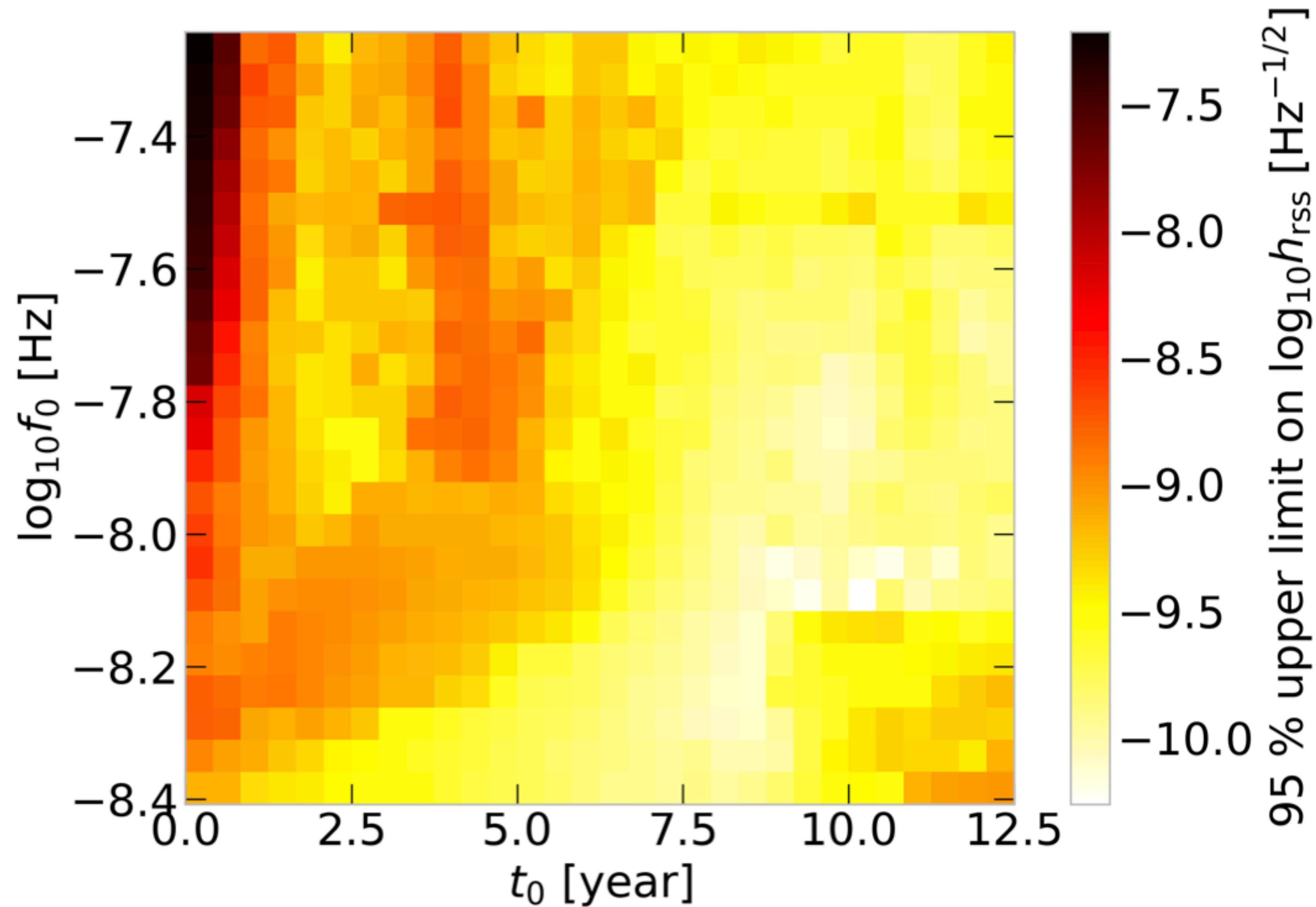
[Becsy & Cornish arXiv 2011.01942]



Detection of a hyperbolic BH scattering event. Note the interplay with the timing model

# BayesWave for PTAs

[Becsy & Cornish arXiv 2011.01942]



Upper limits as a function of time and frequency using a signal-free 12.5 year Astro4Cast simulated data set

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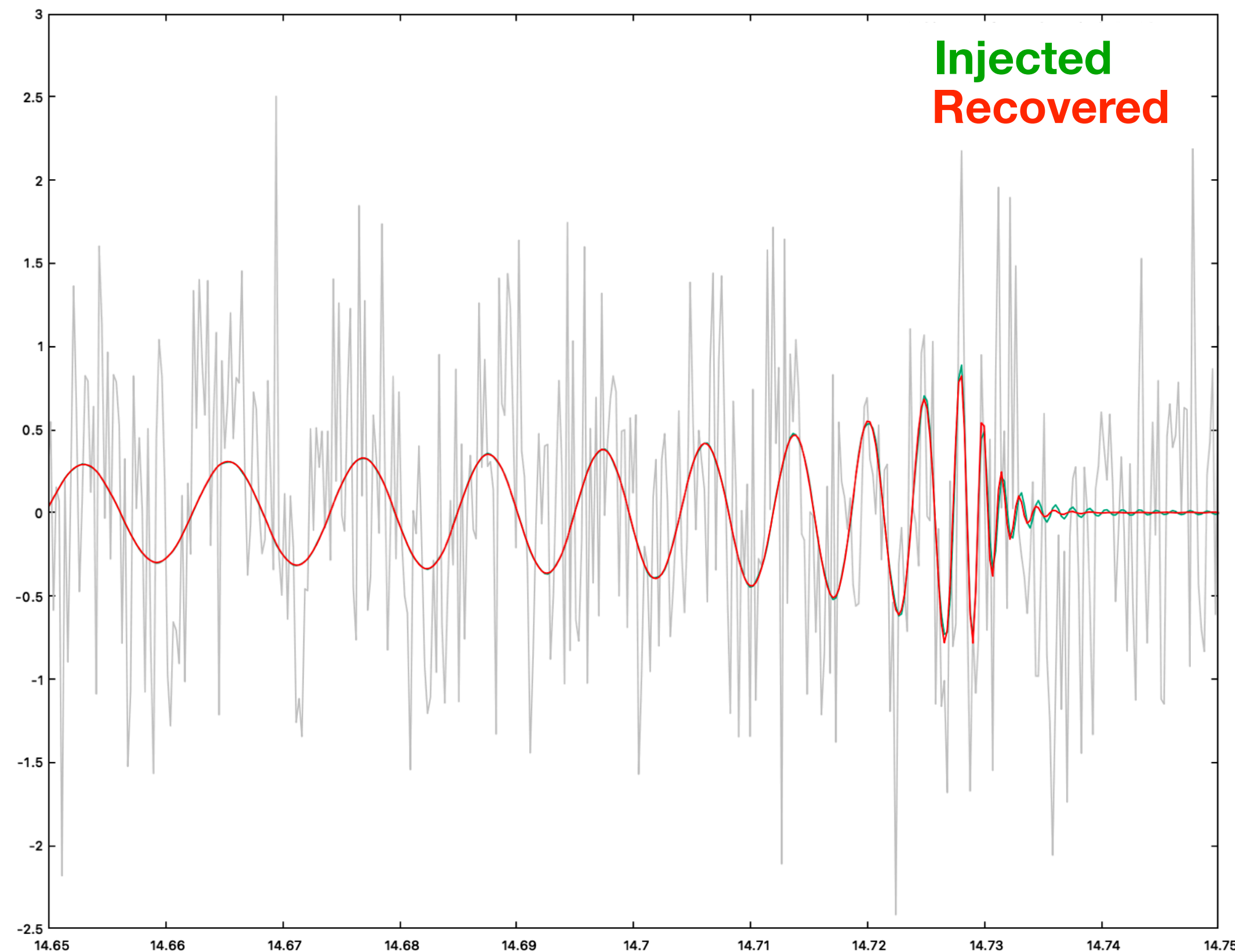


# BayesWaveVoices - LIGO (Gupta & Cornish)

$$h(t) = \sum_n A_n(t) \cos \Phi_n(t)$$

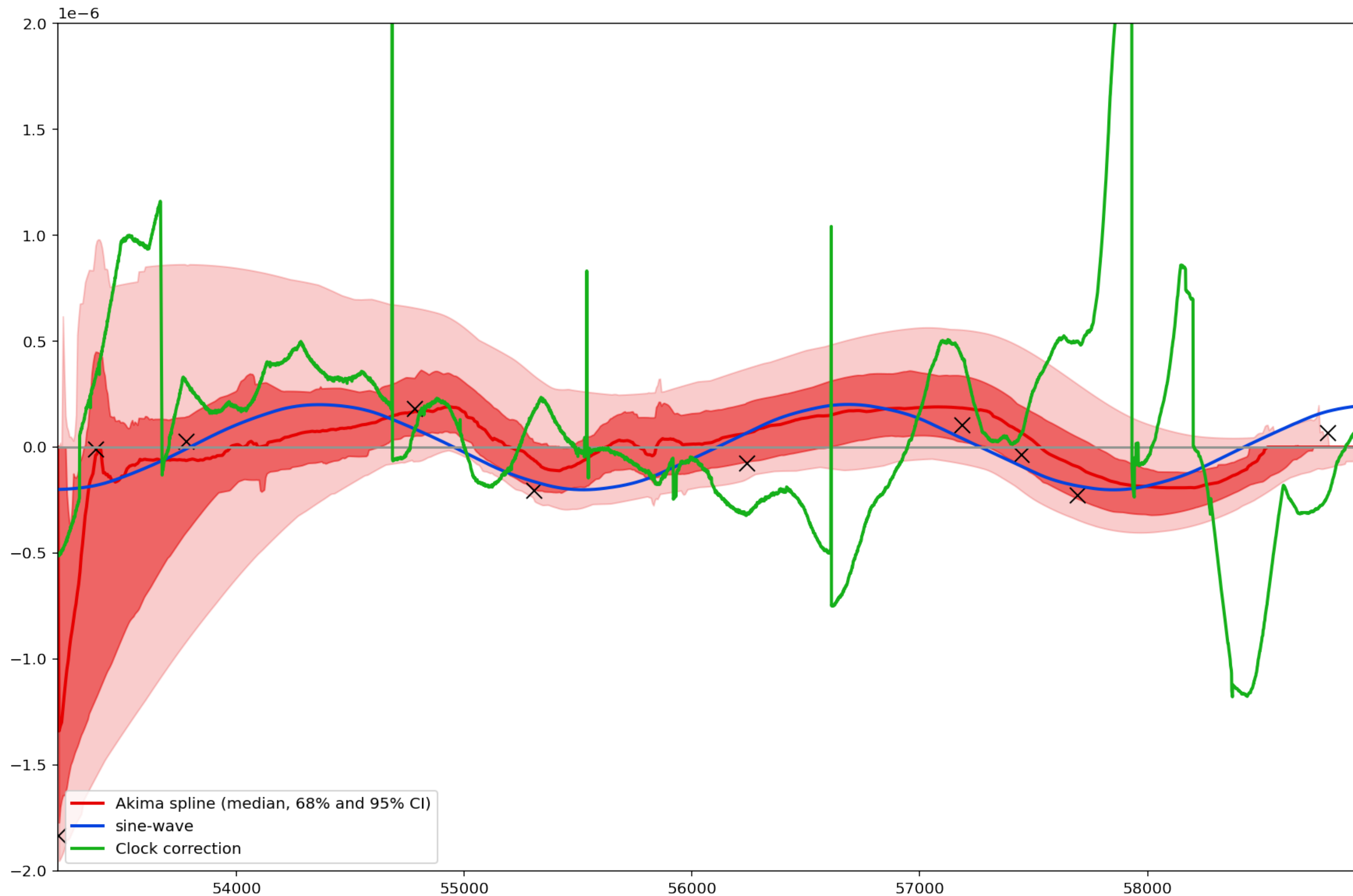
$$\Phi_n(t) = \phi_0 + 2\pi \int^t f_n(t') dt'$$

The amplitude evolution  $A_n(t)$  and frequency evolution  $f_n(t)$  modeled by trans-dimensional Akima splines



Amplitude and frequency share same start and end times (spline knots)

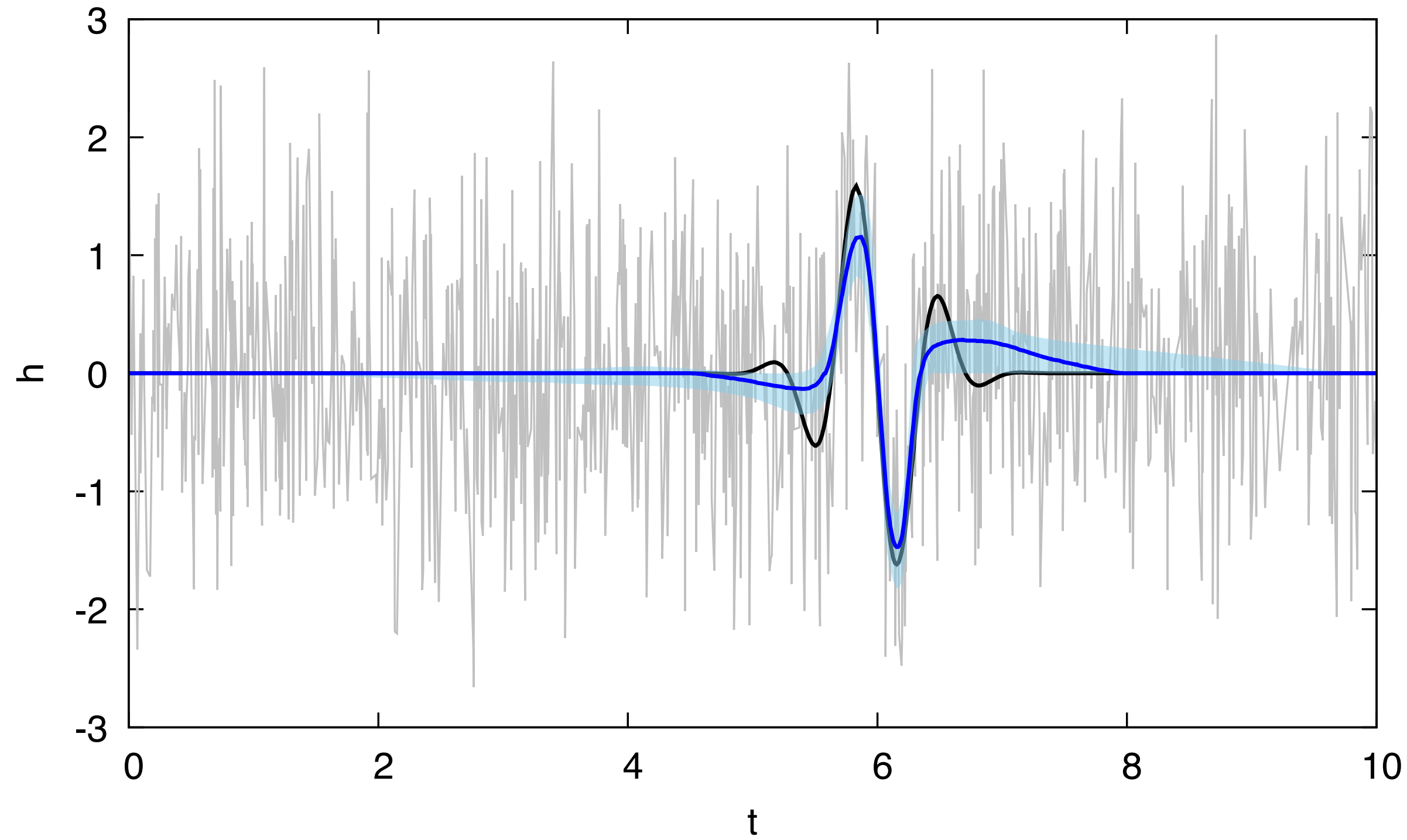
# Monopole Akima Spline (Becsy & Cornish)



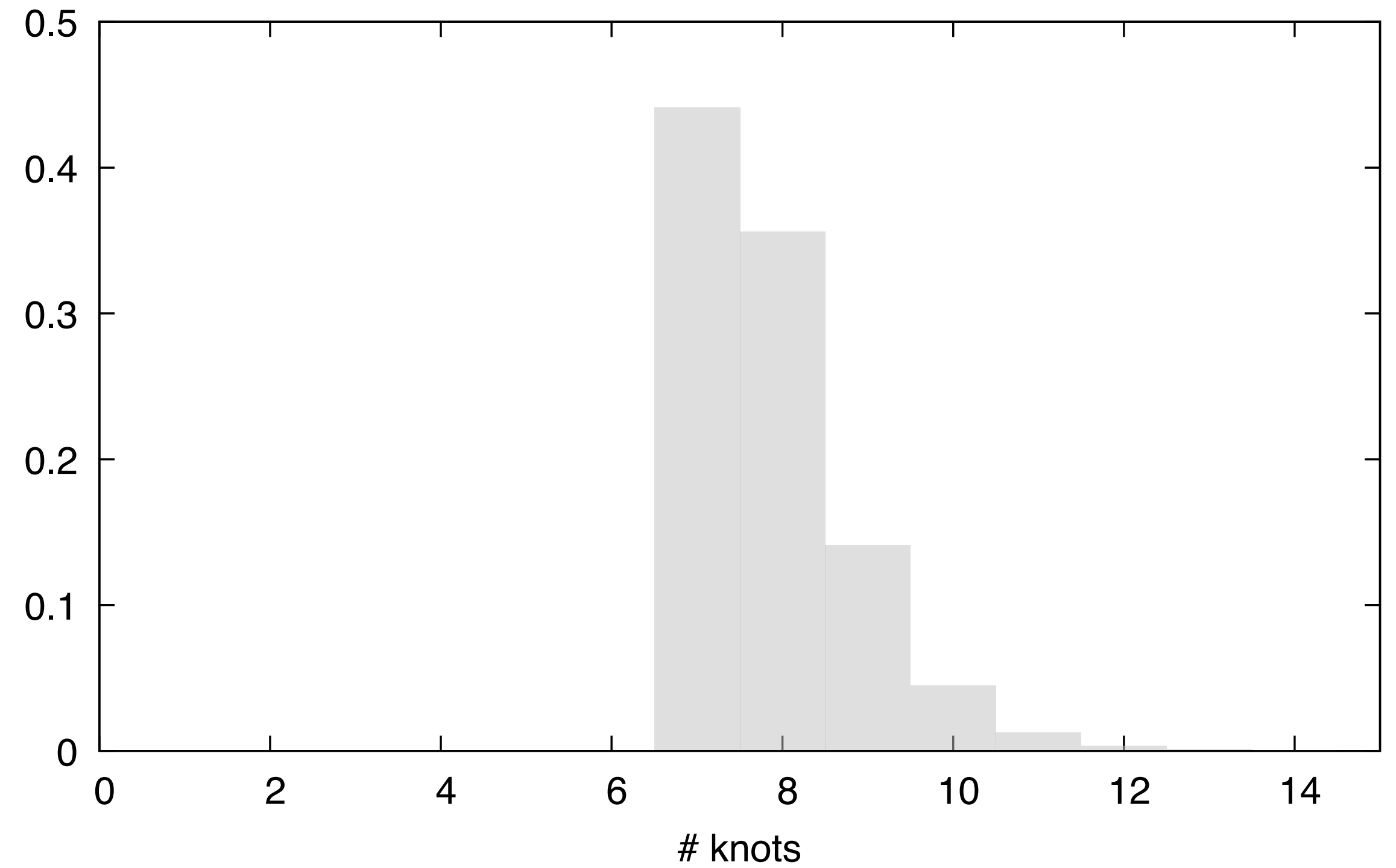
**Trans-dimensional Akima spline used for the monopole**

**Modify code to have two copies - one for  $h_+(t)$  and one for  $h_\times(t)$  and include antenna patterns. Becomes a GW burst search.**

# Akima Splines For Bursts



Here  $h(t)$  is built directly from an Akima spline  
Simulated SG burst has  $S/N = 10$



Using GSL the minimum number of knots is 7

# Akima Spline Burst Search (Becsy & Cornish)

Could model the two polarizations directly, or model the amplitude and frequency evolution like we do with BayesWaveVoices

Can also search for elliptically polarized signals:

$$h_{+}(t) \rightarrow \tilde{h}_{+}(f) \rightarrow i\epsilon\tilde{h}_{+}(f) \rightarrow h_{\times}(t)$$

Use Akima spline interpolation to over-sample  $h_{+}(t)$  on an evenly spaced grid of times then linearly interpolate  $h_{+}(t)$  and  $h_{\times}(t)$  for each pulsar

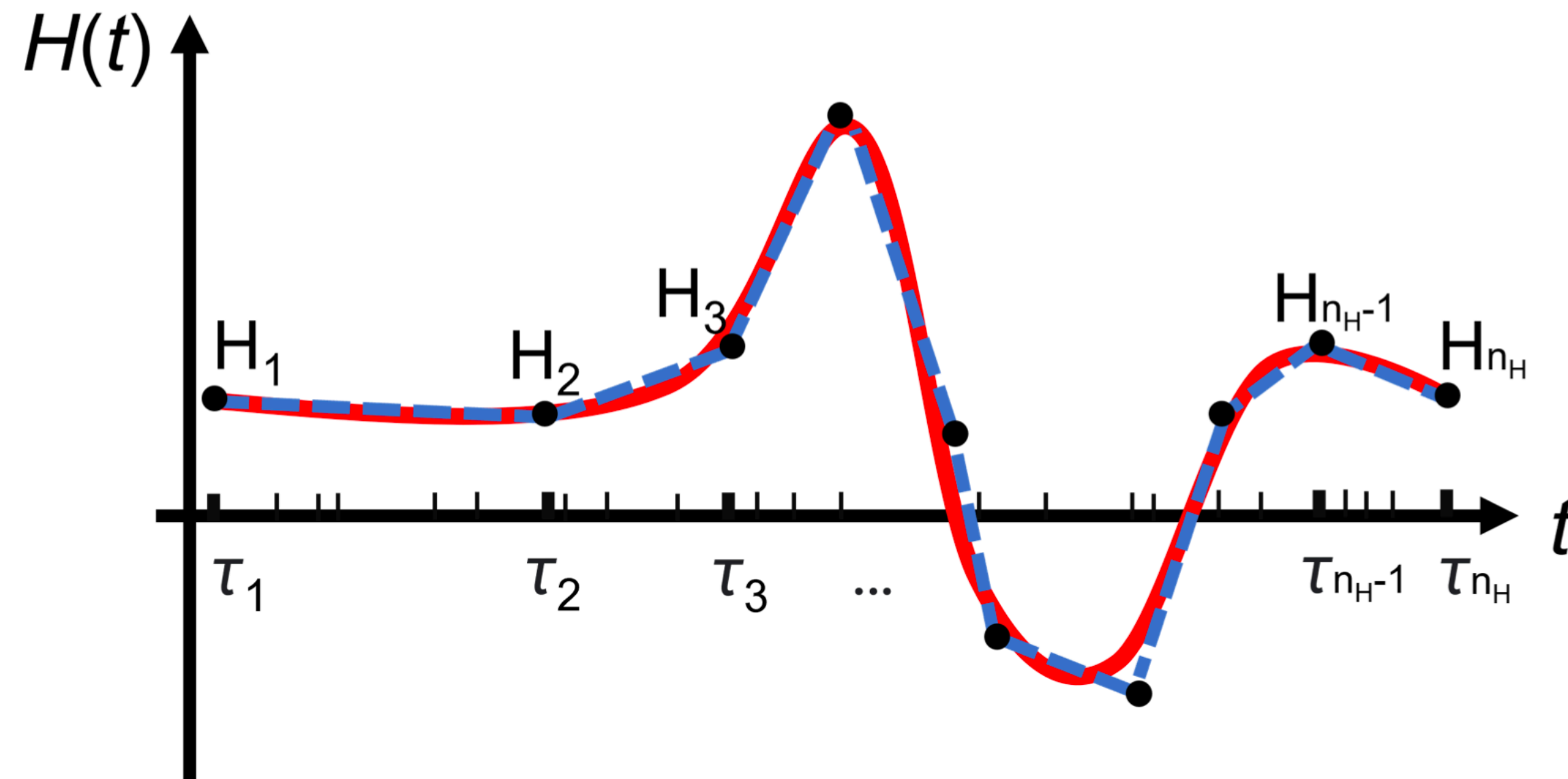
Can use QuickCW tricks to pre-compute inner products. Note that even the sky location becomes a cheap projection parameter since no pulsar terms

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# Line Segment Model

[Deng, Becsy, Siemens, Cornish & Madison, arXiv 2306.17130]

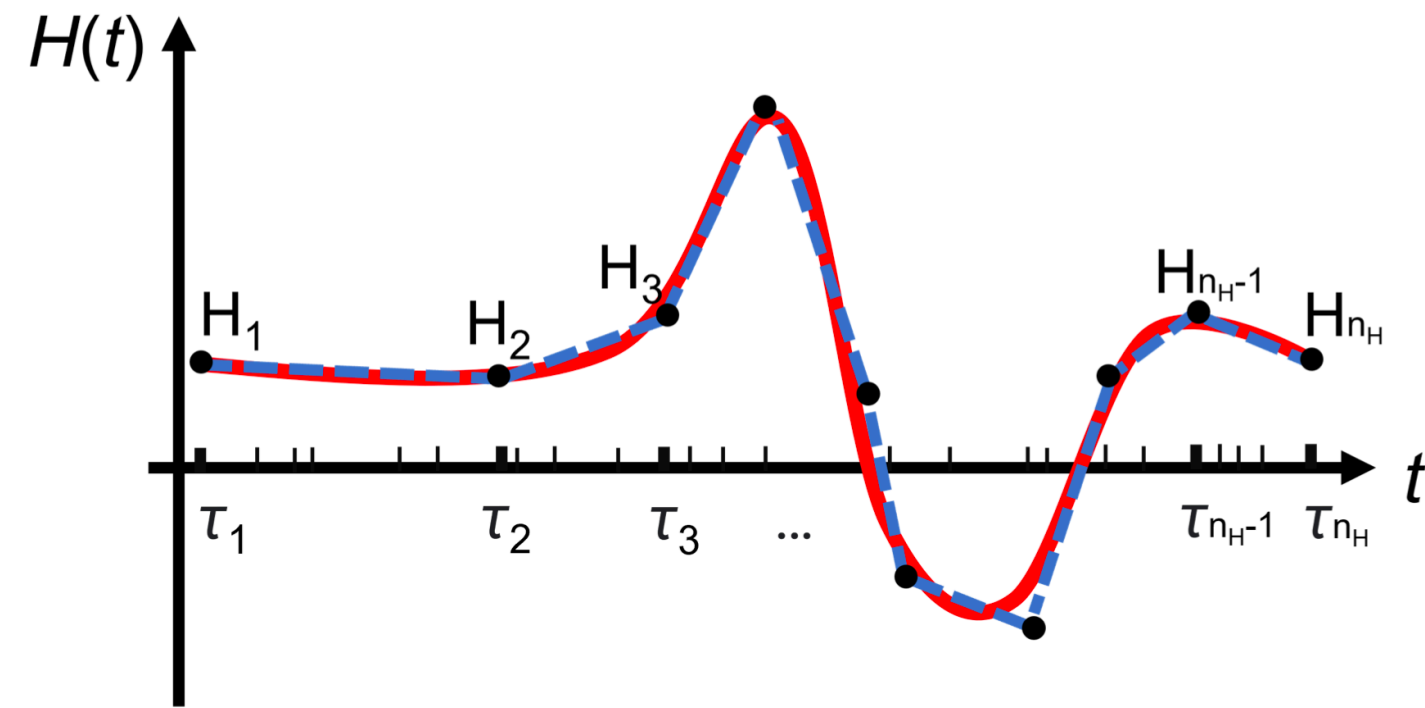


In current version, locations and number of control points is fixed (will RJMCMC this next)

Seems like a downgrade versus the wavelet to smooth spline models, so why do it?

# Line Segment Model

[Deng, Becsy, Siemens, Cornish & Madison, arXiv 2306.17130]



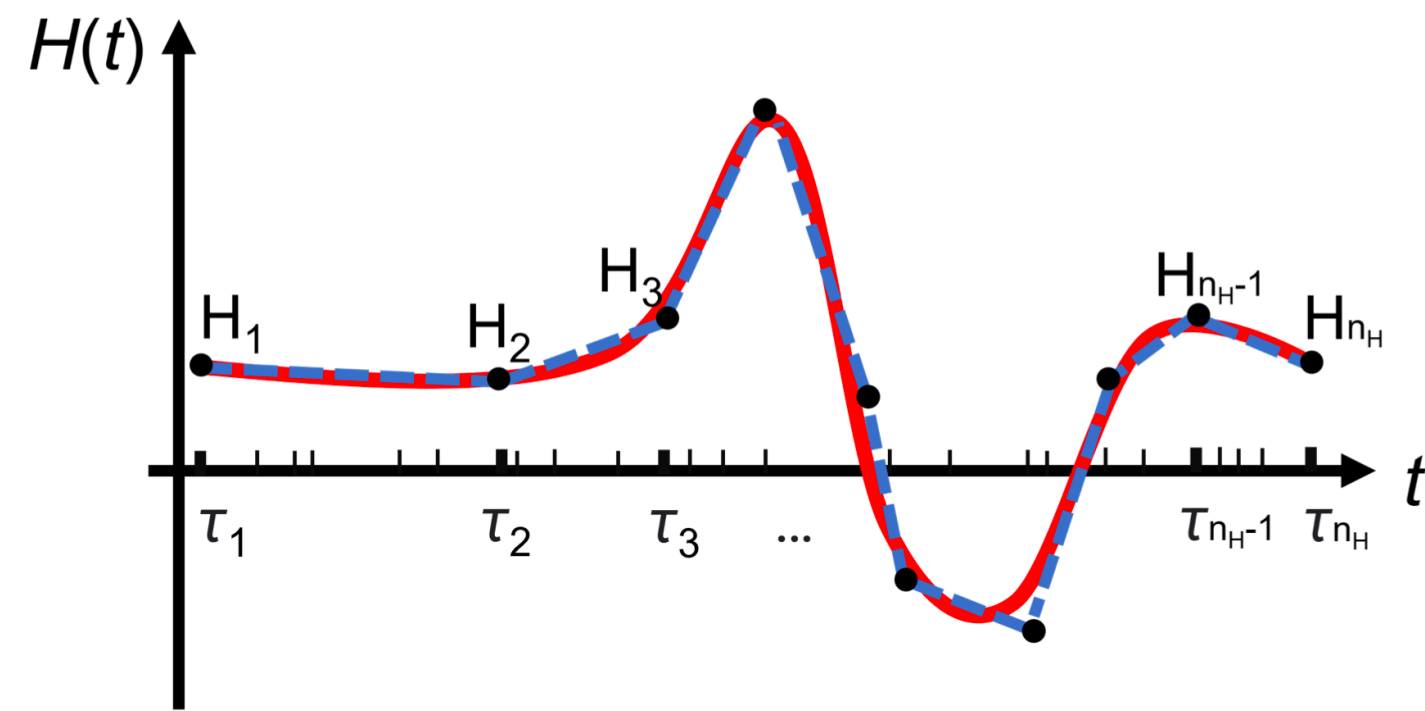
Linear interpolation

$$\begin{pmatrix} H^+(t_1) \\ H^+(t_2) \\ \vdots \\ H^+(t_{n_{\text{toas}}-1}) \\ H^+(t_{n_{\text{toas}}}) \end{pmatrix} \approx \begin{pmatrix} \frac{\tau_2-t_1}{\tau_2-\tau_1} & \frac{t_1-\tau_1}{\tau_2-\tau_1} & 0 & \dots & 0 & 0 \\ \frac{\tau_2-t_2}{\tau_2-\tau_1} & \frac{t_2-\tau_1}{\tau_2-\tau_1} & 0 & \dots & 0 & 0 \\ \vdots & \vdots & \vdots & \ddots & \vdots & \vdots \\ 0 & 0 & 0 & \dots & \frac{\tau_{n_H}-t_{n_{\text{toas}}-1}}{\tau_{n_H}-\tau_{n_H-1}} & \frac{t_{n_{\text{toas}}-1}-\tau_{n_H-1}}{\tau_{n_H}-\tau_{n_H-1}} \\ 0 & 0 & 0 & \dots & \frac{\tau_{n_H}-t_{n_{\text{toas}}}}{\tau_{n_H}-\tau_{n_H-1}} & \frac{t_{n_{\text{toas}}}-\tau_{n_H-1}}{\tau_{n_H}-\tau_{n_H-1}} \end{pmatrix} \begin{pmatrix} H_1^+ \\ H_2^+ \\ \vdots \\ H_{n_H-1}^+ \\ H_{n_H}^+ \end{pmatrix} \equiv \mathbf{P}_I \mathbf{H}^+$$

$$\begin{aligned} h_I &\approx F_I^+ \mathbf{P}_I \mathbf{H}^+ + F_I^\times \mathbf{P}_I \mathbf{H}^\times \\ &= (F_I^+ \mathbf{P}_I \quad F_I^\times \mathbf{P}_I) \begin{pmatrix} \mathbf{H}^+ \\ \mathbf{H}^\times \end{pmatrix} \equiv \mathbf{S}_I \mathbf{H} \end{aligned}$$

# Line Segment Model

[Deng, Becsy, Siemens, Cornish & Madison, arXiv 2306.17130]



Marginalize over  $\mathbf{H}$

$$\begin{aligned}\mathcal{L}(\mathbf{r}|\boldsymbol{\eta}, \theta, \phi, q) &= \int \mathcal{L}(\mathbf{r}|\boldsymbol{\eta}, \theta, \phi, \mathbf{H})\pi(\mathbf{H}|q)d\mathbf{H} \\ &= \int \mathcal{N}(\mathbf{r}|\mathbf{C}) \frac{\exp \left[ [\mathbf{r}|\mathbf{S}] \mathbf{H} - \frac{1}{2} \mathbf{H}^\top ([\mathbf{S}|\mathbf{S}] + \mathbf{Q}^{-1}) \mathbf{H} \right]}{\sqrt{\det(2\pi\mathbf{Q})}} d\mathbf{H} \\ &= \mathcal{N}(\mathbf{r}|\mathbf{C}) \frac{\exp \left( \frac{1}{2} [\mathbf{r}|\mathbf{S}] \boldsymbol{\Sigma}^{-1} [\mathbf{S}|\mathbf{r}] \right)}{\sqrt{\det(\mathbf{Q}\boldsymbol{\Sigma})}}, \quad \boldsymbol{\Sigma} \equiv [\mathbf{S}|\mathbf{S}] + \mathbf{Q}^{-1}\end{aligned}$$

We don't have to explicitly search over the amplitudes  $H_i^+$ ,  $H_i^\times$ , so **fast!**

Can reconstruct the signal from the posterior samples (analogous to how we integrate out the coefficients of the Fourier expansion of the GW background)



# Burst Search Outlook

- Two burst search pipelines (wavelet and line segment) are under development and will soon be applied to the NASOGrav 15-yr data set
- Akima spline based search built using QuickCW + Akima monopole codes is under development
- Exploratory runs using wavelet and line segment approaches are starting now