

# BayesHopper

## *Joint Search for Isolated Sources and a Stochastic Background in PTA Data*

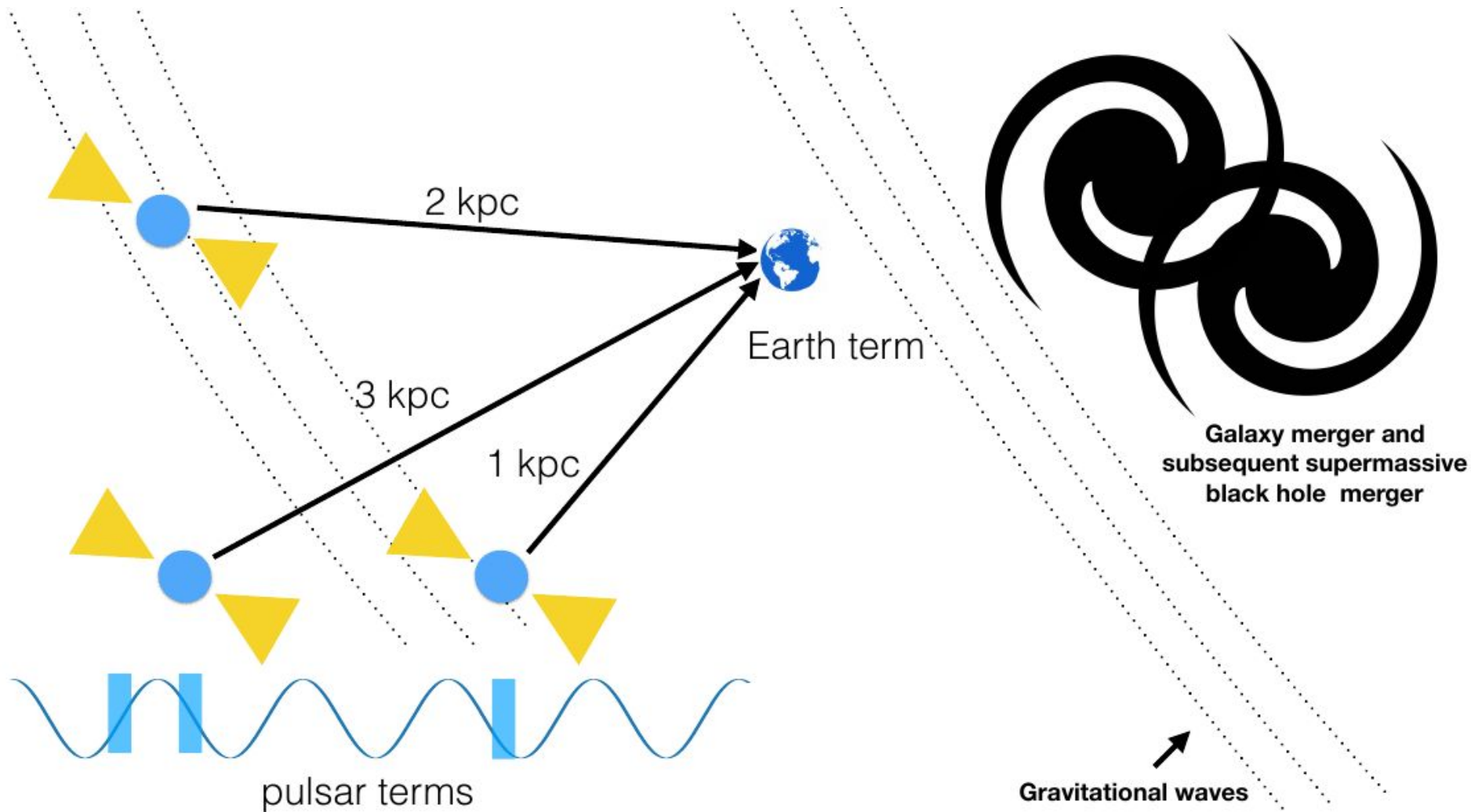
Bence Bécsy

Advisor: Prof. Neil Cornish



Gravitational Wave Astronomy Northwest Meeting  
06/29/2020

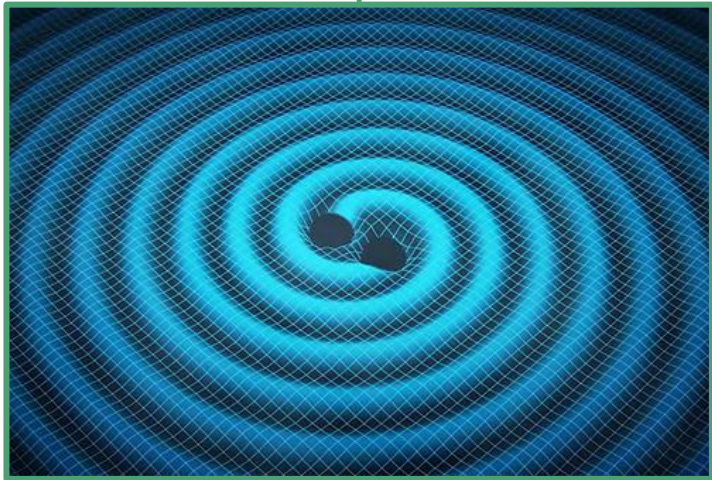
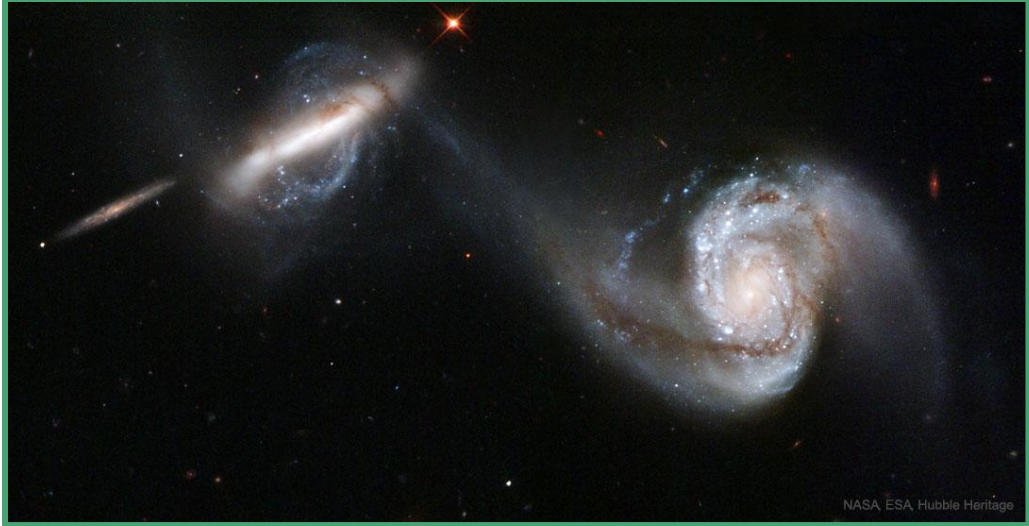
# Pulsar Timing Arrays



[1] Image credit: Burke-Spolaor, Taylor et al. (2018) arXiv:1811.08826



# nHz gravitational wave sources



x many



**Stochastic background** (binary ensemble)



**Continuous wave** (single binary)

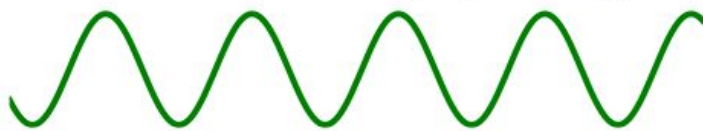
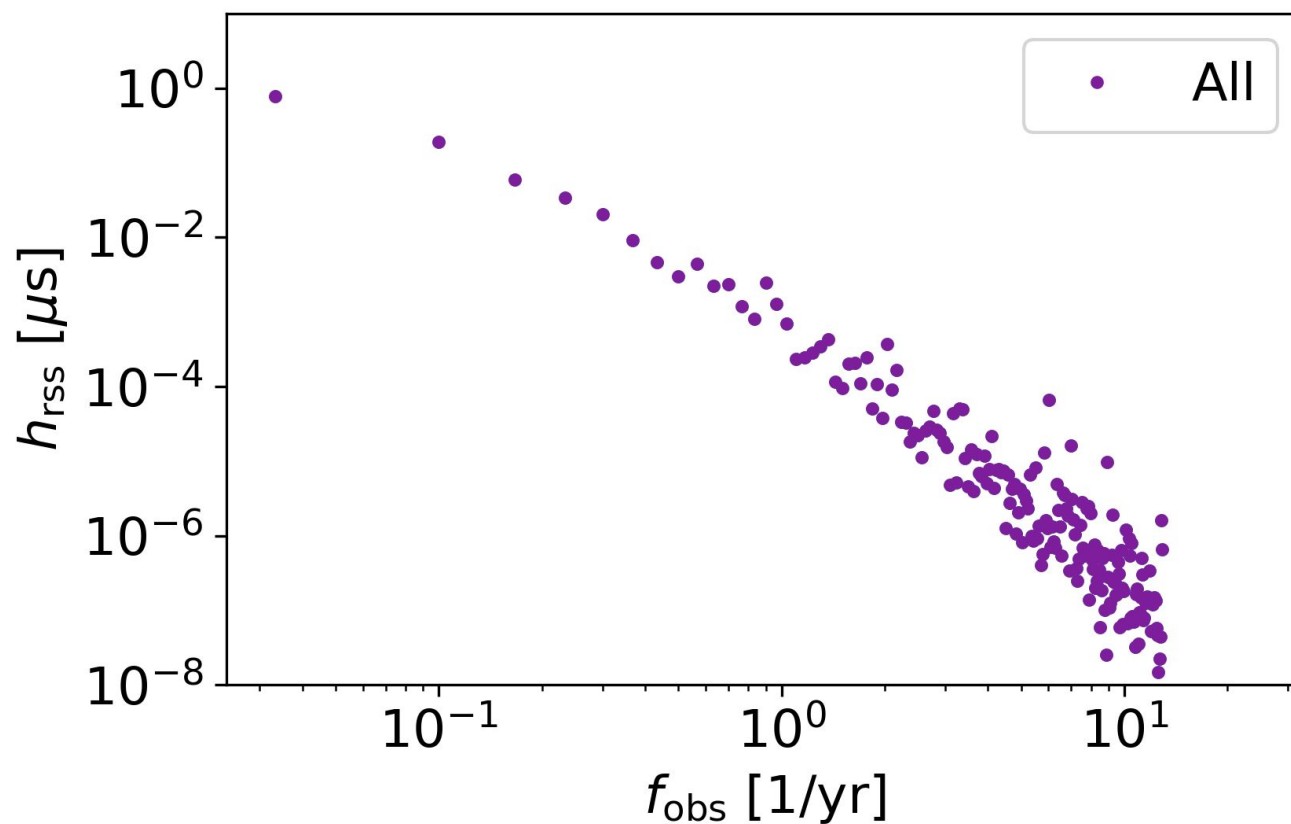


Image credit: [1] NASA, ESA, Hubble Heritage Team (STScI, AURA), APOD ([apod.nasa.gov/apod/ap190811.html](http://apod.nasa.gov/apod/ap190811.html)); [2] Swinburne Astronomy Productions; [3] NANOGrav Public Slide Deck (<http://nanograv.org/press/>)

# Motivation - true model vs. best model

~3.7 million simulated BBH source - 15 yr baseline

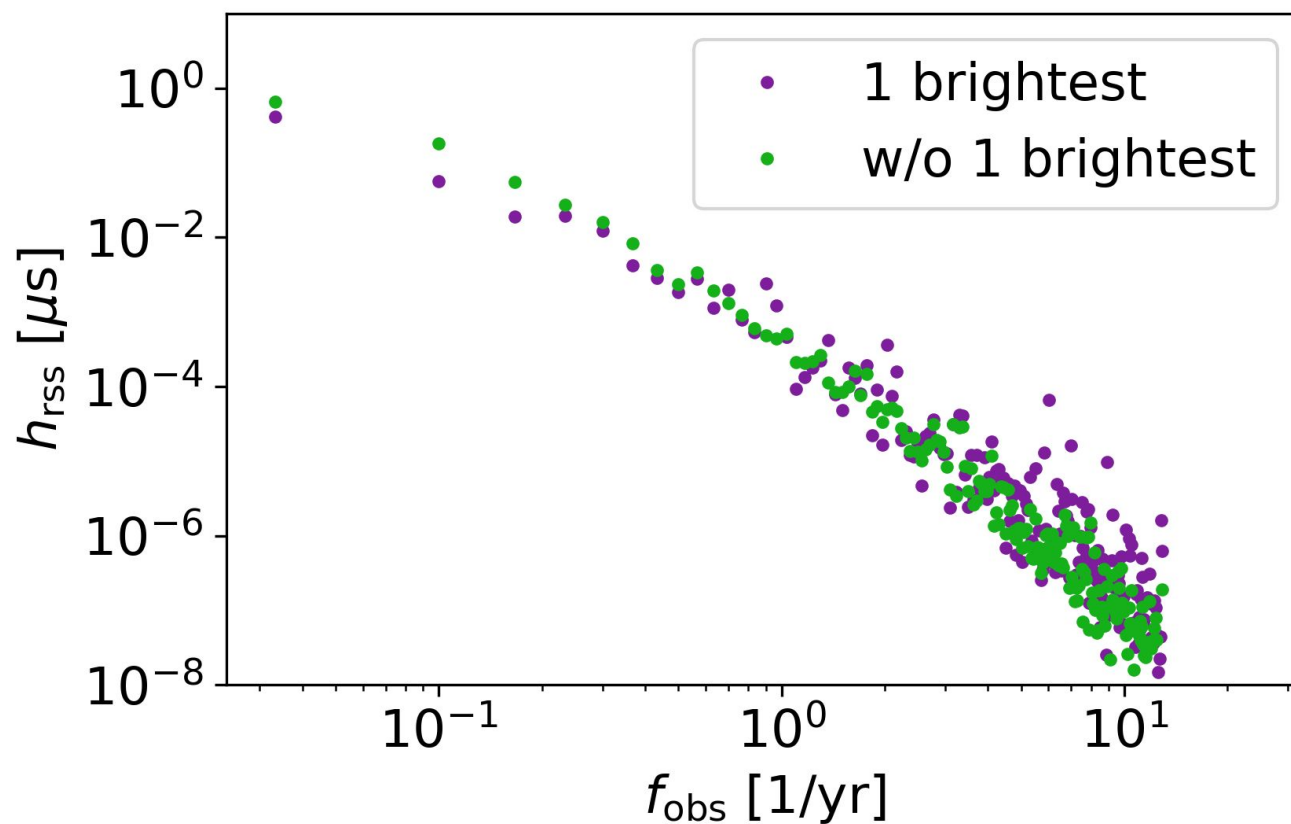


Dataset: Kelley et al. (2017) arXiv:1711.00075



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~3.7 million simulated BBH source - 15 yr baseline

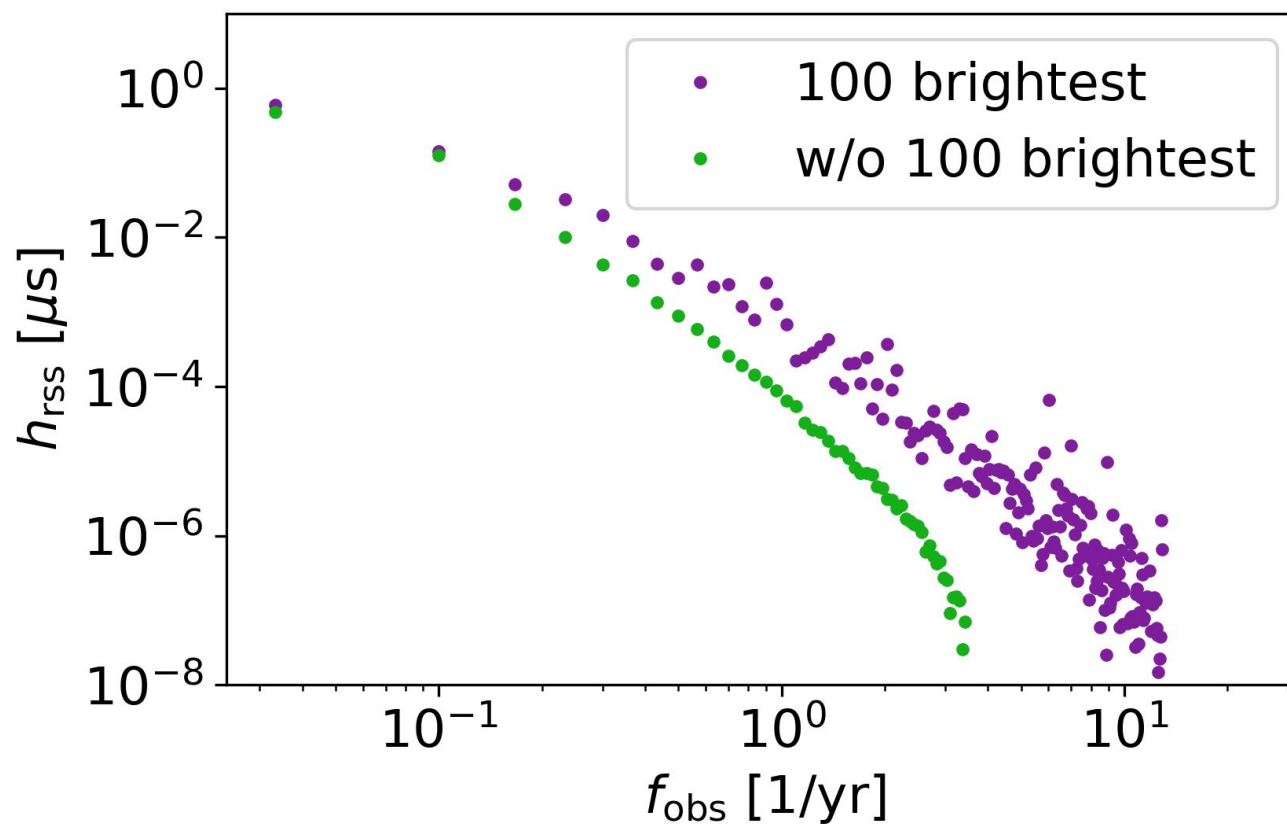


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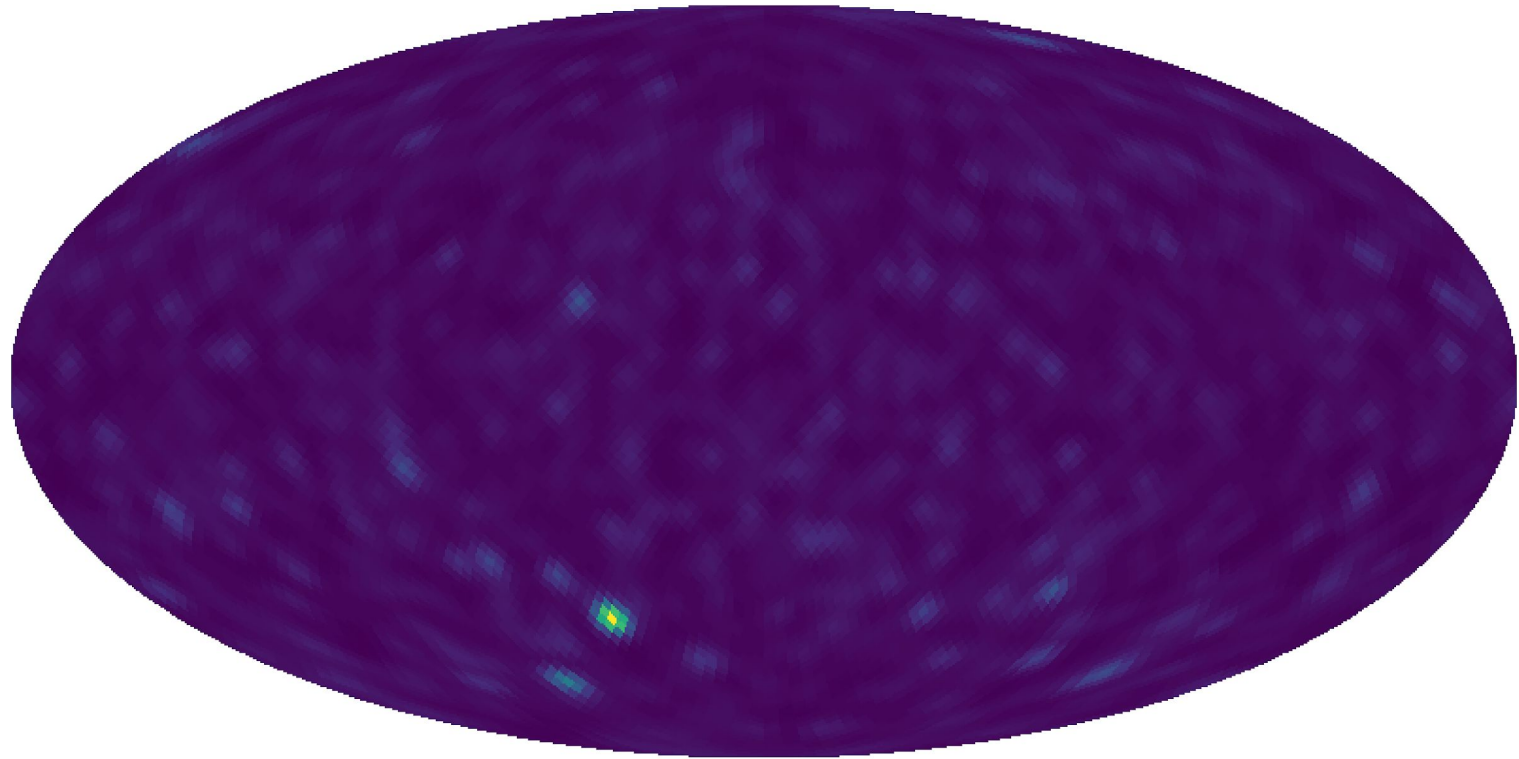




# Motivation - true model vs. best model

~3.7 million simulated BBH source - 15 yr baseline

All sources - Lowest frequency bin



-1.75891e-09

4.86306e-08

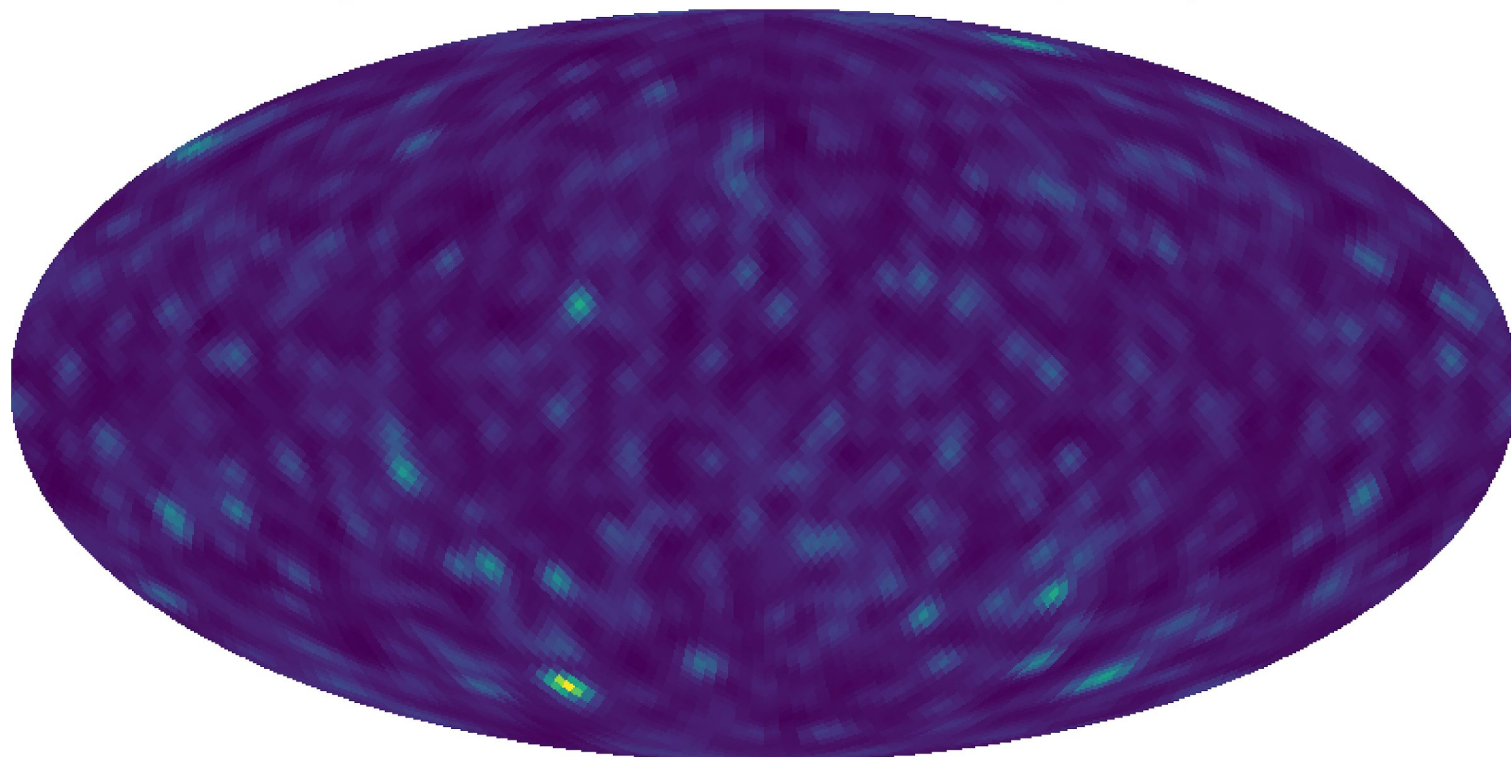
Dataset: Kelley et al. (2017) arXiv:1711.00075



# Motivation - true model vs. best model

~3.7 million simulated BBH source - 15 yr baseline

1 brightest removed - Lowest frequency bin



Dataset: Kelley et al. (2017) arXiv:1711.00075

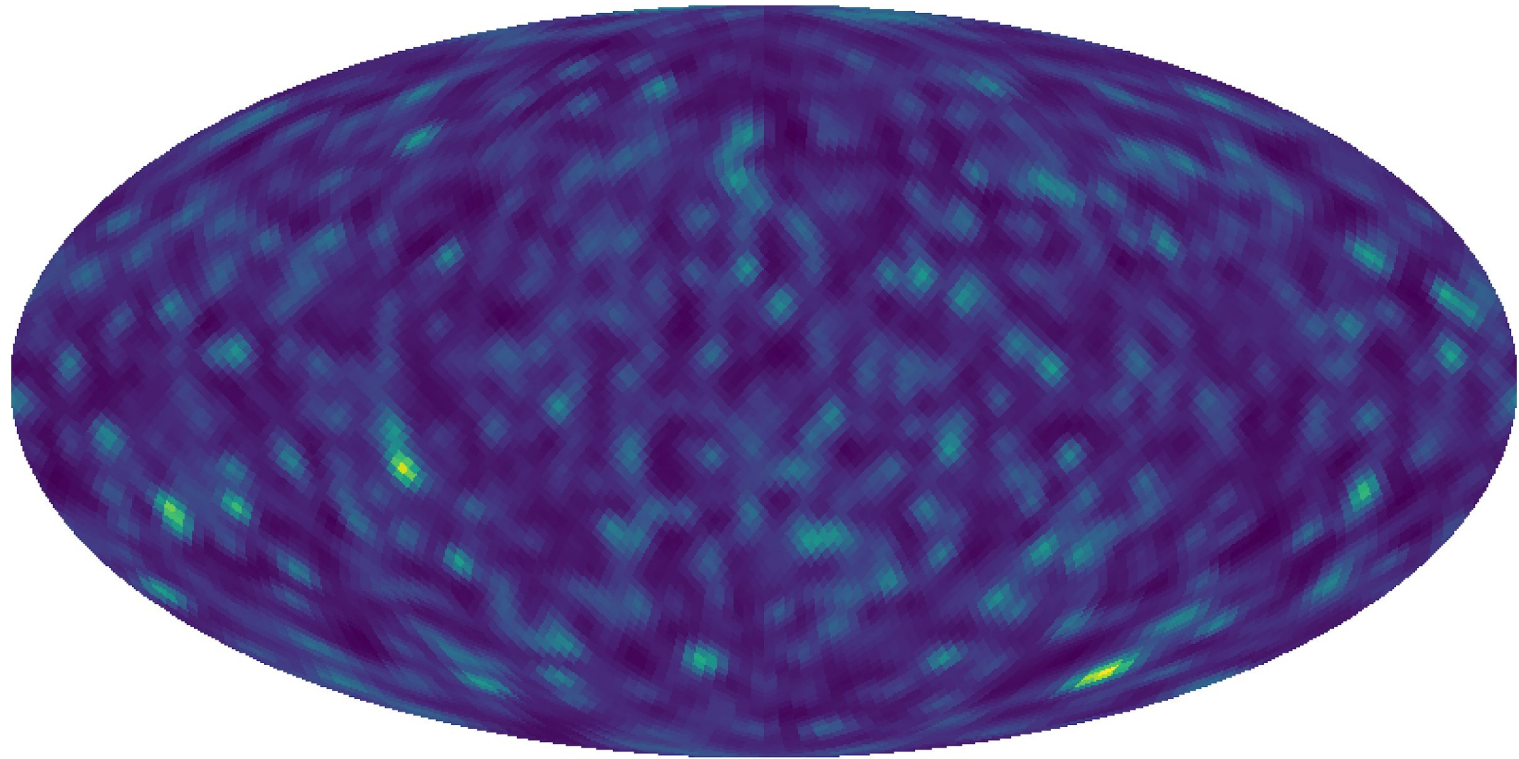




# Motivation - true model vs. best model

~3.7 million simulated BBH source - 15 yr baseline

10 brightest removed - Lowest frequency bin



-1.66347e-09

1.0073e-08

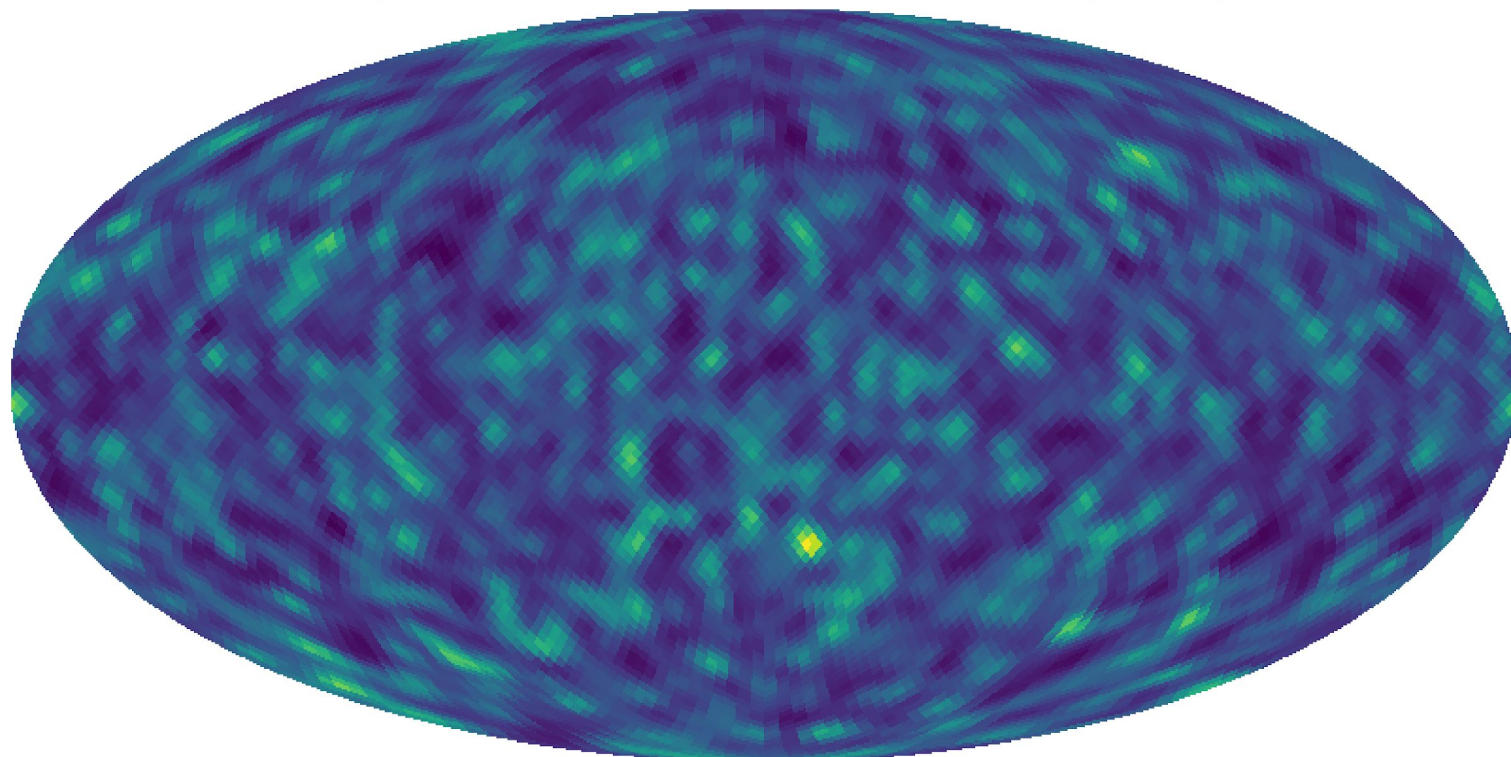
Dataset: Kelley et al. (2017) arXiv:1711.00075



# Motivation - true model vs. best model

~3.7 million simulated BBH source - 15 yr baseline

100 brightest removed - Lowest frequency bin



-1.51535e-09

4.47392e-09

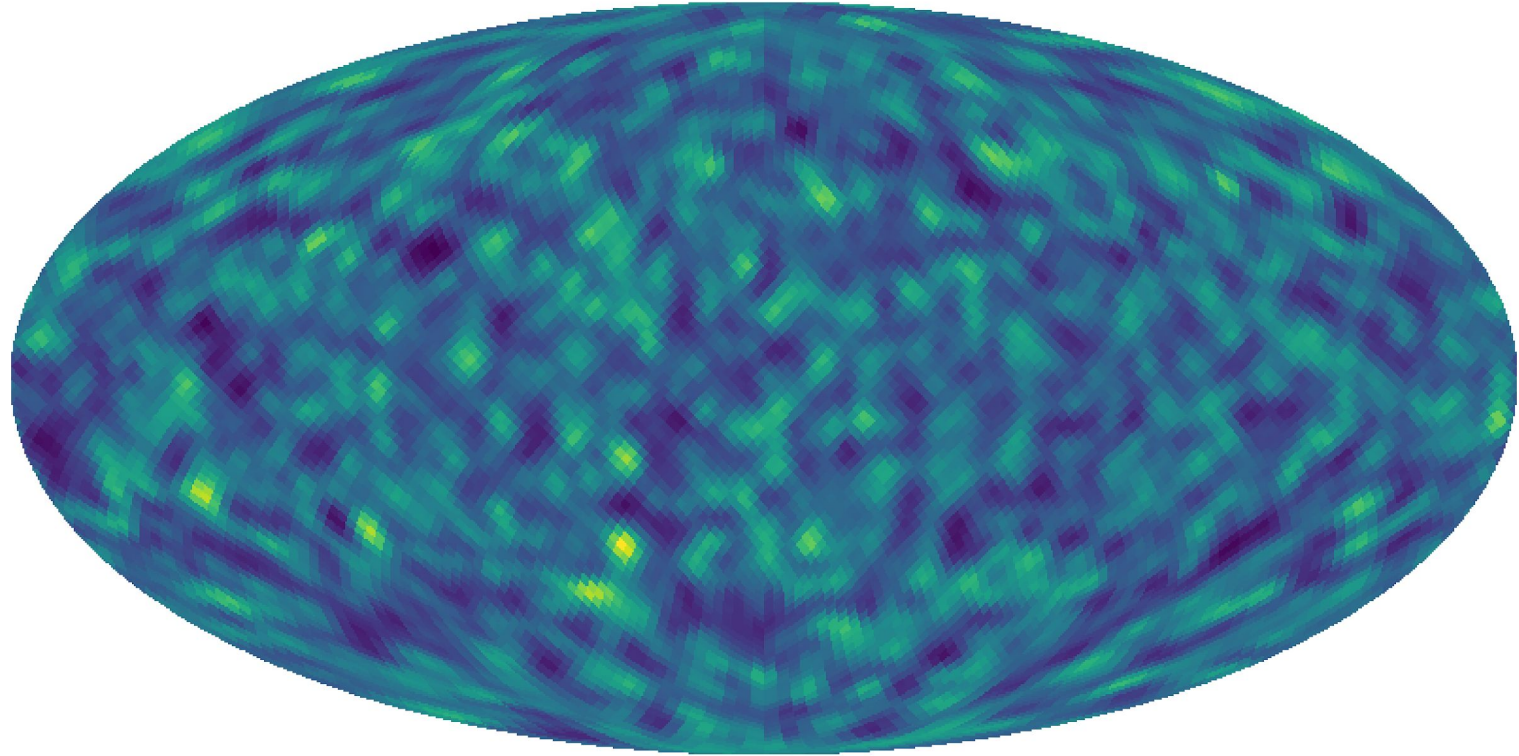
Dataset: Kelley et al. (2017) arXiv:1711.00075



# Motivation - true model vs. best model

~3.7 million simulated BBH source - 15 yr baseline

1000 brightest removed - Lowest frequency bin



-1.03205e-09

1.89663e-09

Dataset: Kelley et al. (2017) arXiv:1711.00075



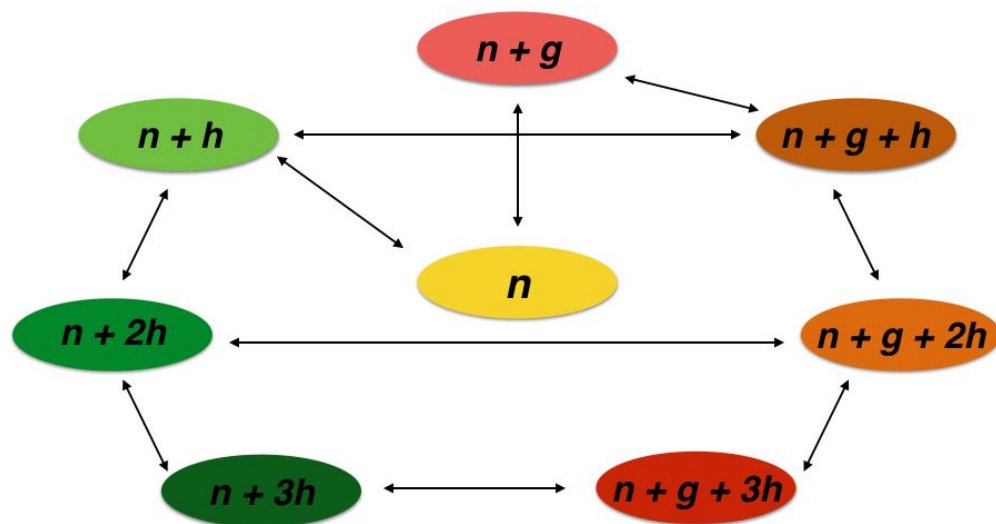


# BayesHopper



Joint search for isolated sources and an unresolved background

→ Trans-dimensional MCMC



$n$ : Gaussian noise

$h$ : individual black hole binary

$g$ : stochastic GW background



# MCMC proposals

- 1) Fisher jumps
- 2) Parallel tempering
- 3) Add/remove a CW source (also using  $F_e$ -statistic)
- 4) Add/remove GW background
- 5) **Global proposal based on  $F_e$ -statistic**

Likelihood =  $p(d|\theta)$

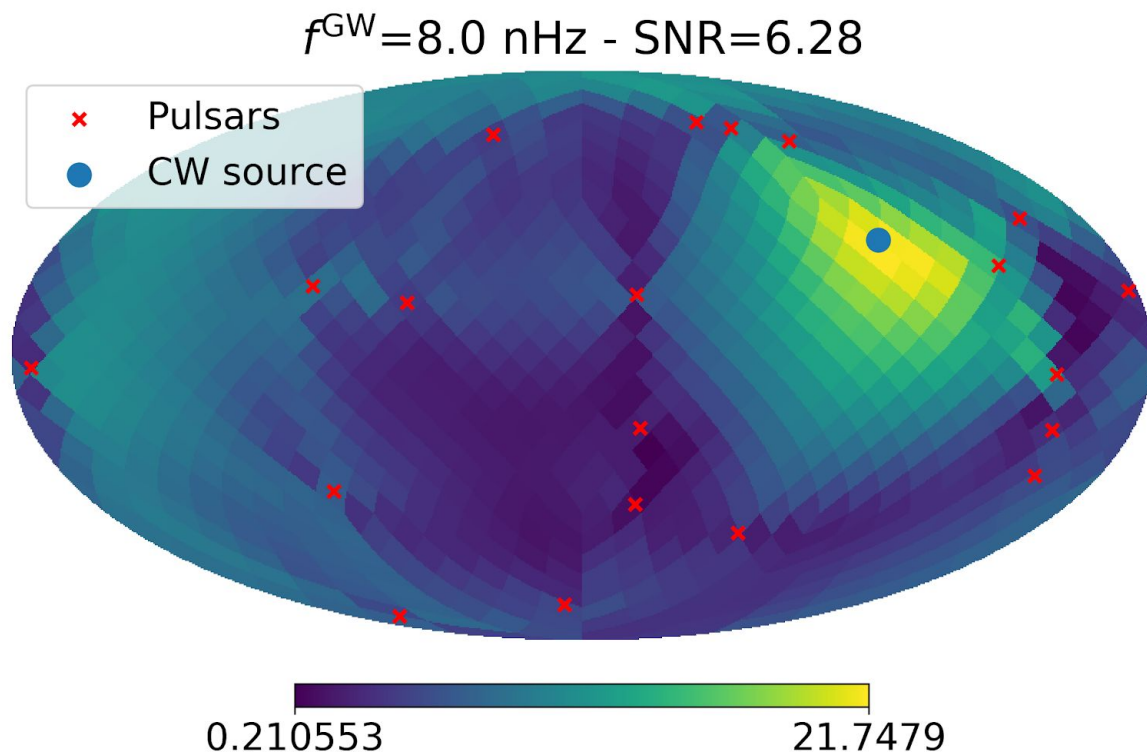
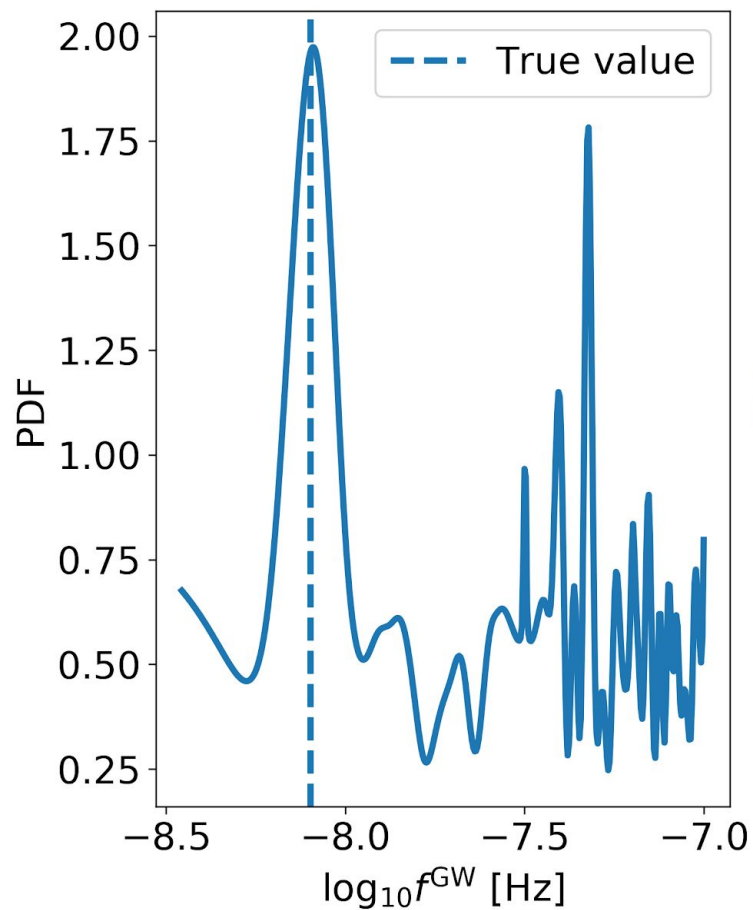
$\Theta = \{\text{frequency, sky location(2), inclination, polarization angle, initial phase, amplitude\}$

4 out of 7 parameters can be analytically maximized over  $\rightarrow F_e(\text{frequency, sky location})$



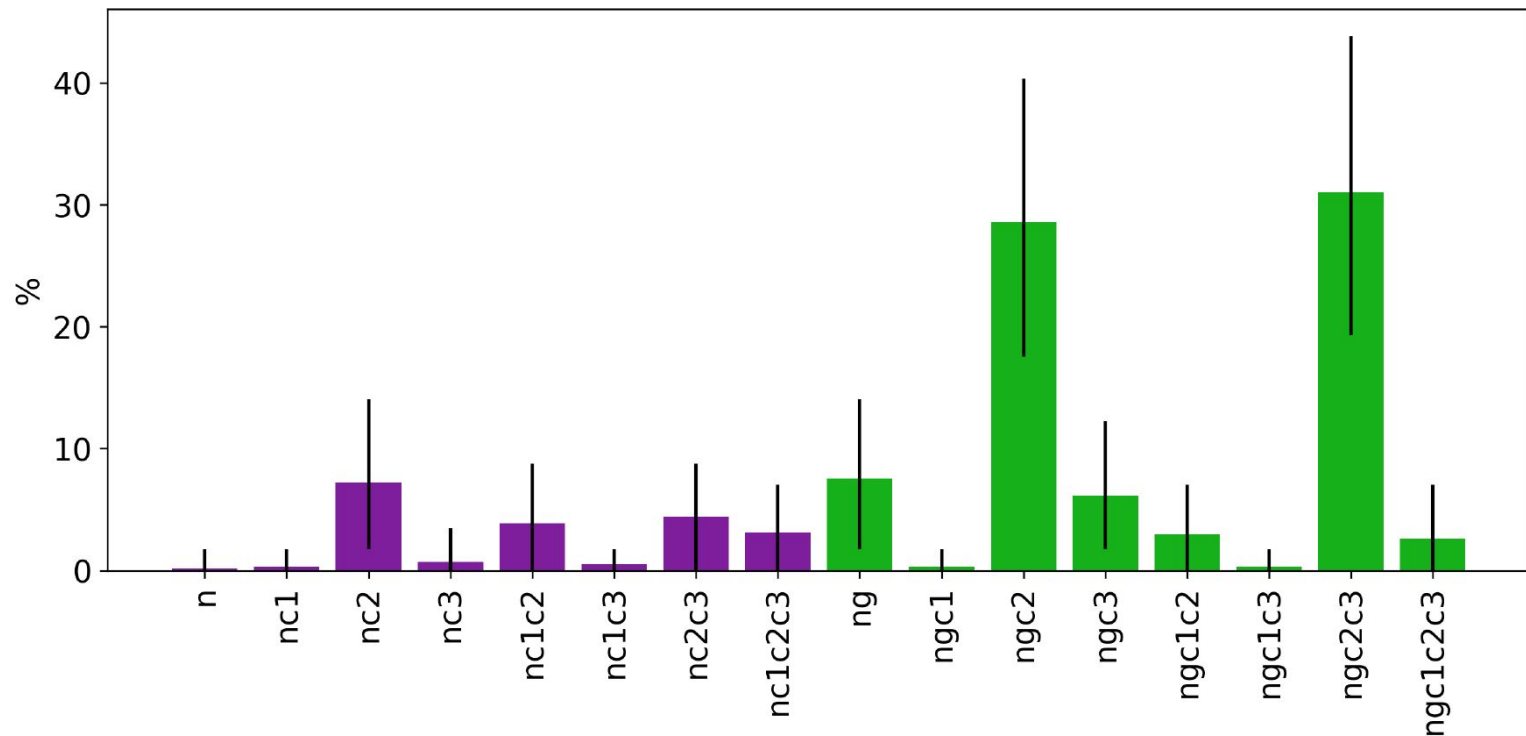


# MCMC proposals

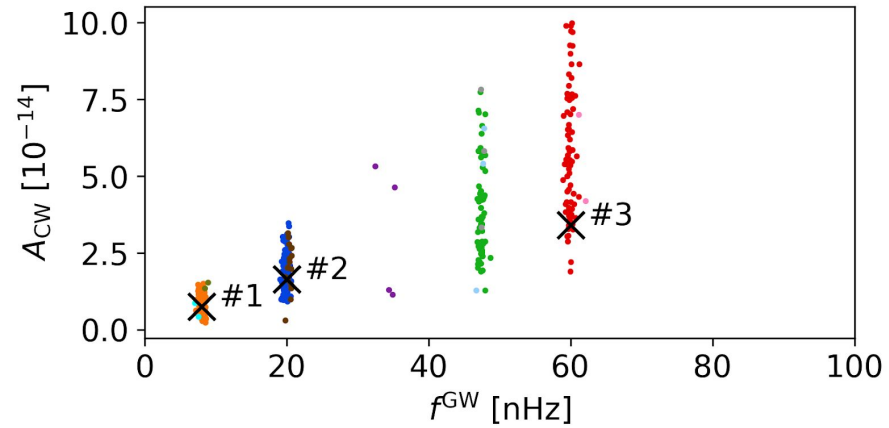


# Testing on simple simulated datasets

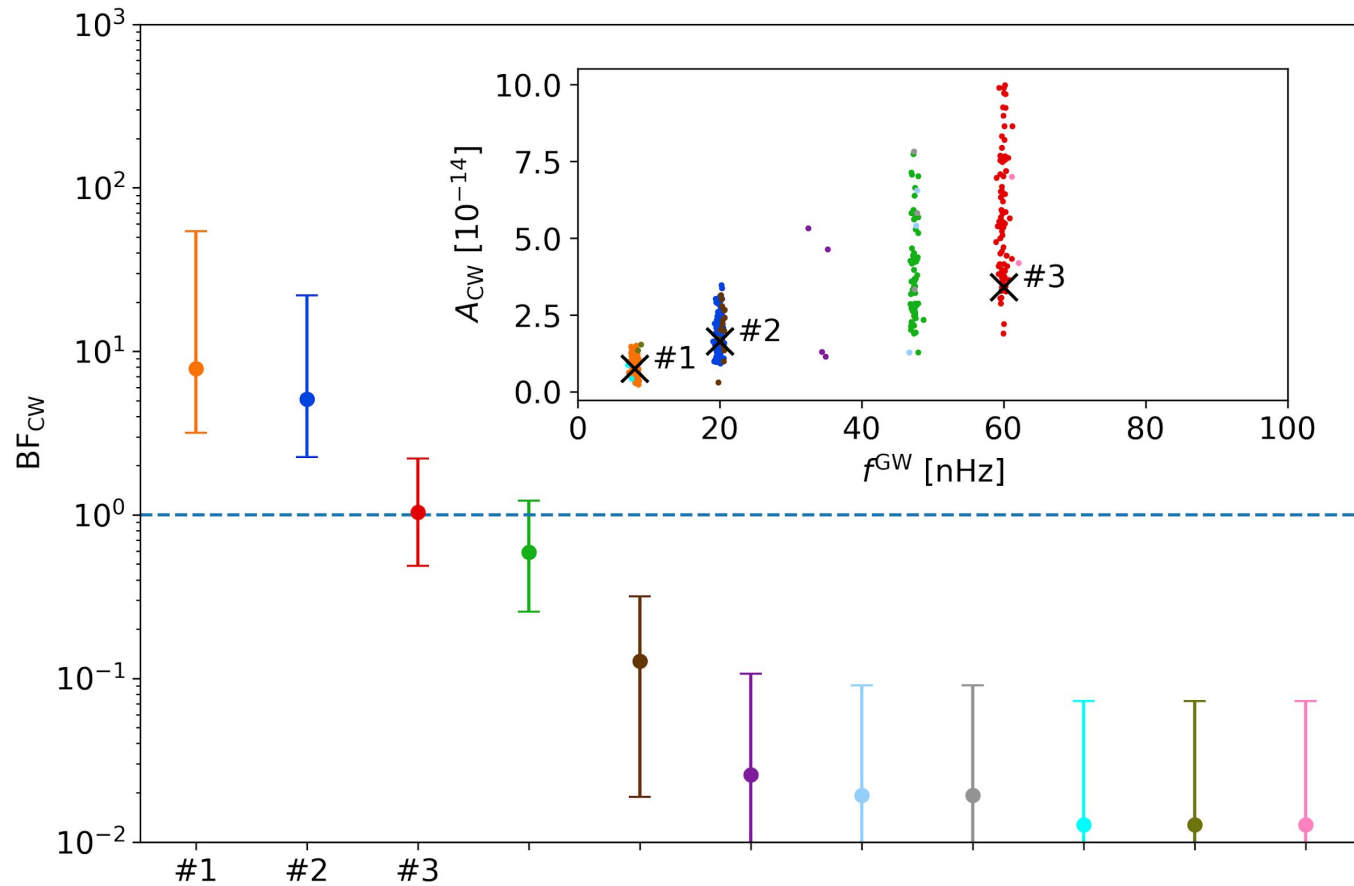
- 1) Stochastic background
- 2) A single individual source
- 3) 3 individual sources
- 4) Stochastic background + 3 individual sources



# Post-processing



# Post-processing



# Conclusion & Future work

## Conclusion

We have a working trans-dimensional sampler for PTA data.

→ Let's use it!

## Future work:

- 1) Multiple CW + GWB search
  - a) Test on astrophysical simulated datasets (Project with Luke Kelley)
  - b) Analyze NANOGrav data
- 2) Use same sampler with wavelets for a burst search





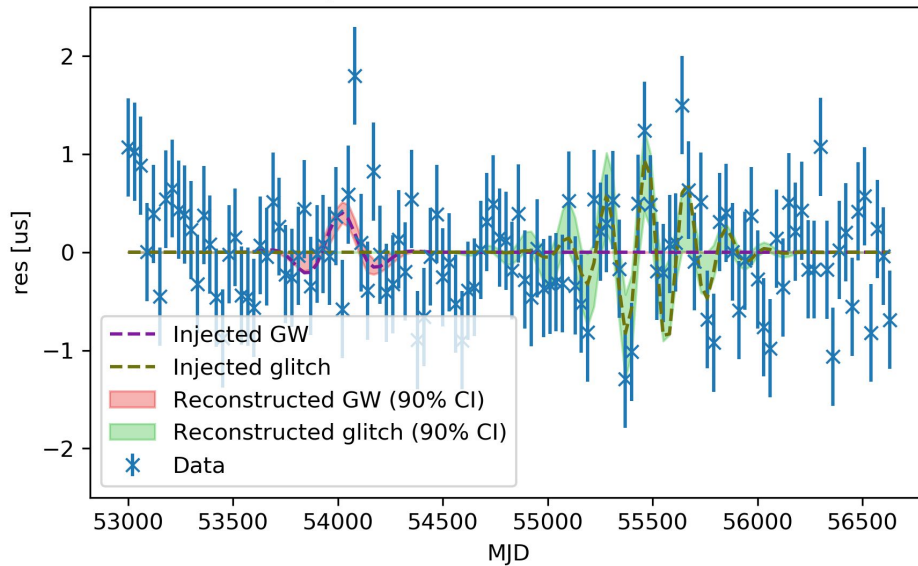
# BayesHopperBurst

sine-Gaussian (Morlet-Gábor) wavelets form a frame → “any” signal can be reconstructed

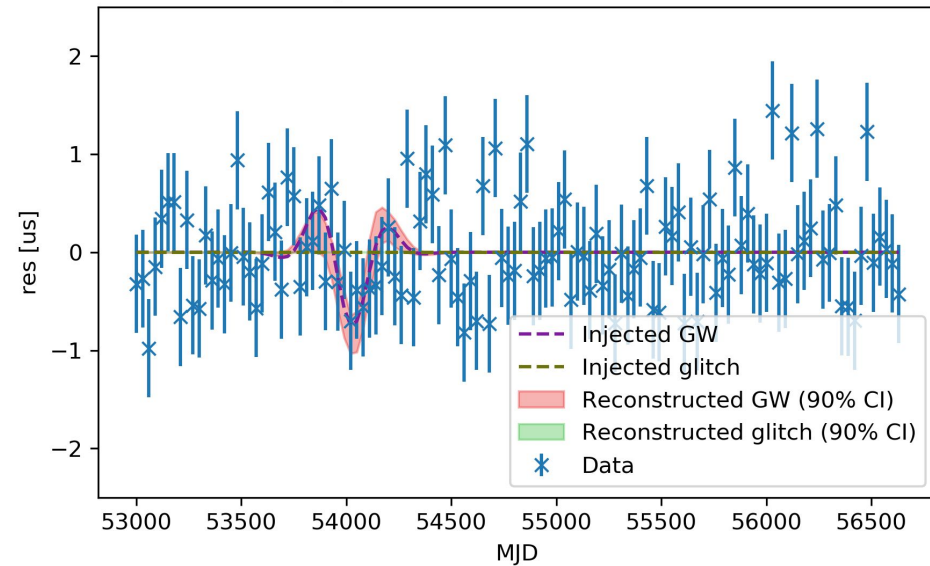
BayesWave [1] uses this for LIGO → We are making the PTA version now!

Code almost done! Needs a few more details and testing on simulated datasets.

JPSR00 - rms res = 0.54 us



JPSR19 - rms res = 0.51 us



[1] Cornish and Littenberg 2015 CQG 32 135012 (arXiv:1410.3835)