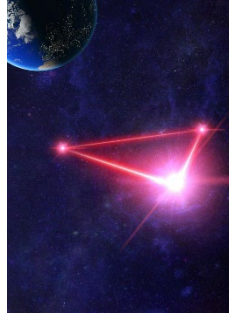




UNIVERSITY OF MINNESOTA



# Searching for the Stochastic Gravitational Wave Background with LISA

Vuk Mandic, University of Minnesota  
August 2, 2022

Phase Transitions and Topological Defects in the Early Universe

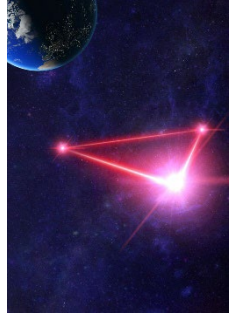


# Overview



- Gravitational waves and LISA
- Stochastic Gravitational Wave Background (SGWB)
- Challenges and complexities in searching for SGWB
- BLIP: a possible framework to handle these challenges
- Conclusions

# Gravitational Waves



- 1916: Linearized Einstein's Equation (weak field regime) becomes a wave equation in the metric.
  - » Gravitational waves stretch and shrink space.
- Two polarizations:

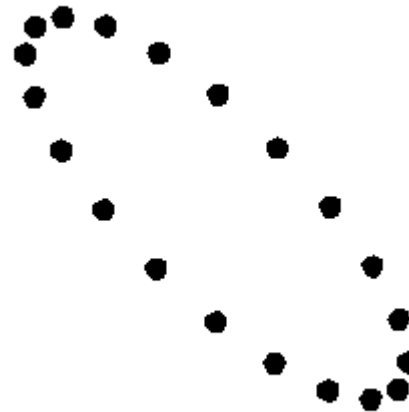
$$G_{\mu\nu} = K T_{\mu\nu}$$

↑

$$K \sim G / c^4$$



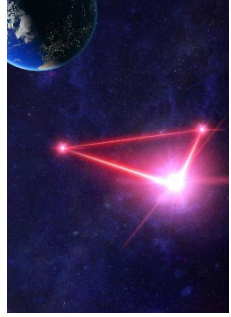
“+” Polarization



“x” Polarization

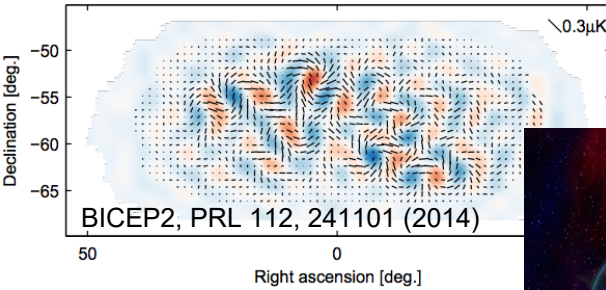


# Gravitational-Wave Spectrum

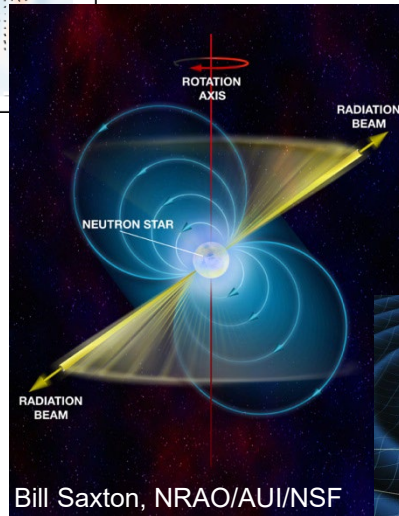


Frequency →

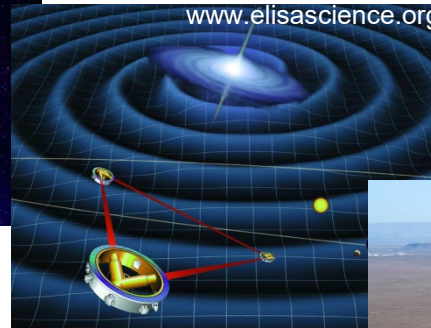
BICEP2: B signal



CMB

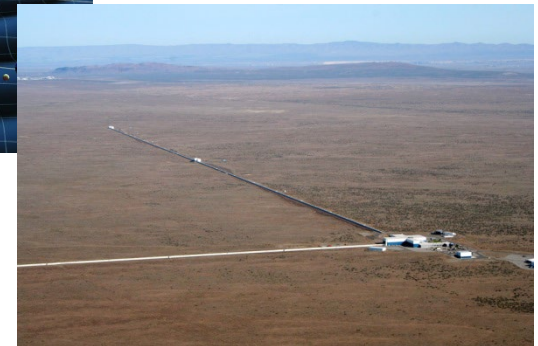


Pulsar timing



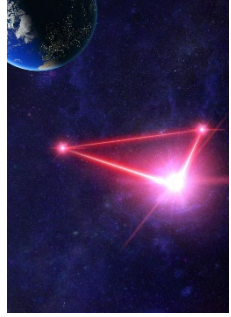
Satellite Detectors

Terrestrial Detectors

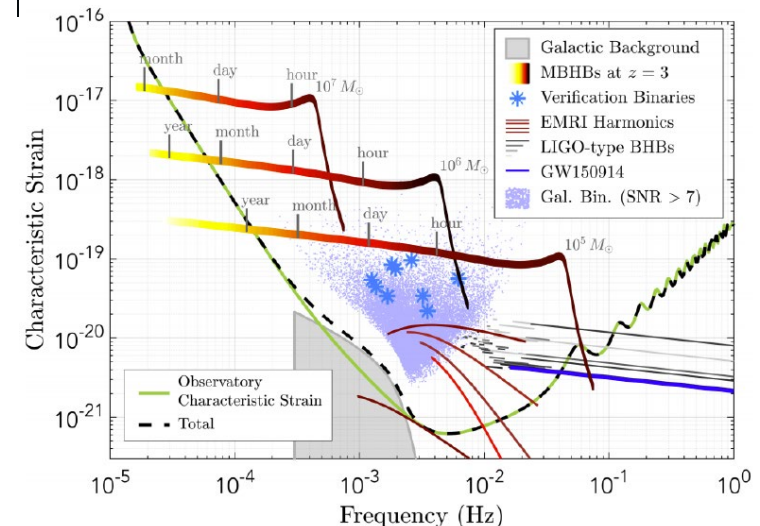
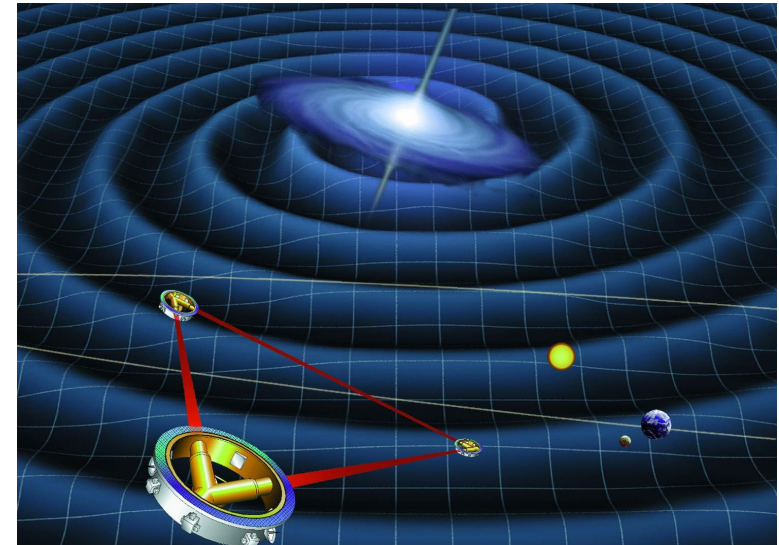




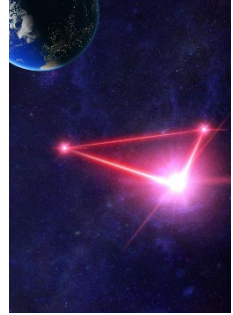
# LISA



- Laser Interferometer Space Antenna (LISA)
- Joint ESA/NASA project, scheduled to launch in 2035.
  - » Three satellites in a triangular configuration, 2.5 Mkm sides.
  - » Operating at the Lagrange point, trailing the Earth.
  - » Pairs of laser beams in each arm, phases compared in each vertex.
  - » 5+ years of observation
- Rich science potential, many GW sources in the LISA band.

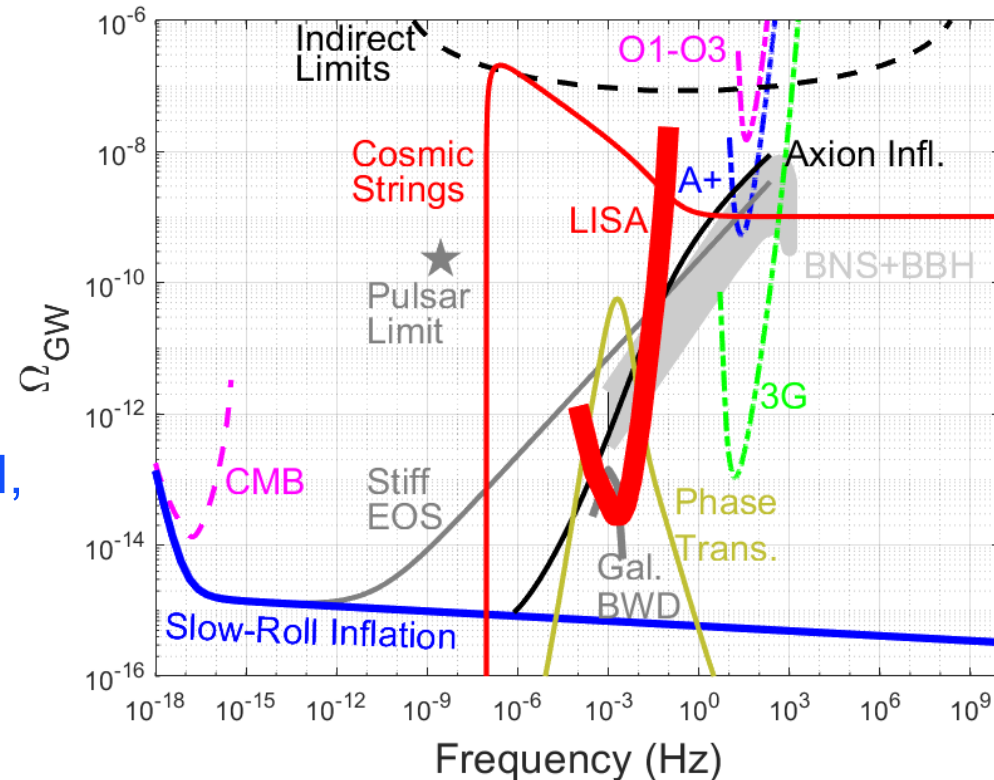


# Stochastic GW Background



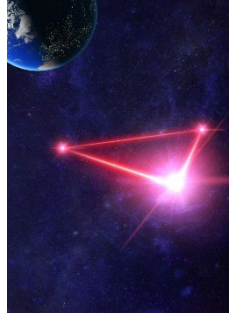
- Superposition of contributions from many uncorrelated GW sources.
- Cosmological:
  - » Inflationary models
  - » Phase transitions
  - » Cosmic (super)strings
  - » Alternative cosmologies
- Astrophysical:
  - » Compact binaries: DWD, BBH, BNS, BHNS...
  - » Supermassive BH, Rotating NS, planets...

$$\Omega_{GW}(f) = \frac{1}{\rho_c} \frac{d\rho_{GW}(f)}{d \ln f}$$



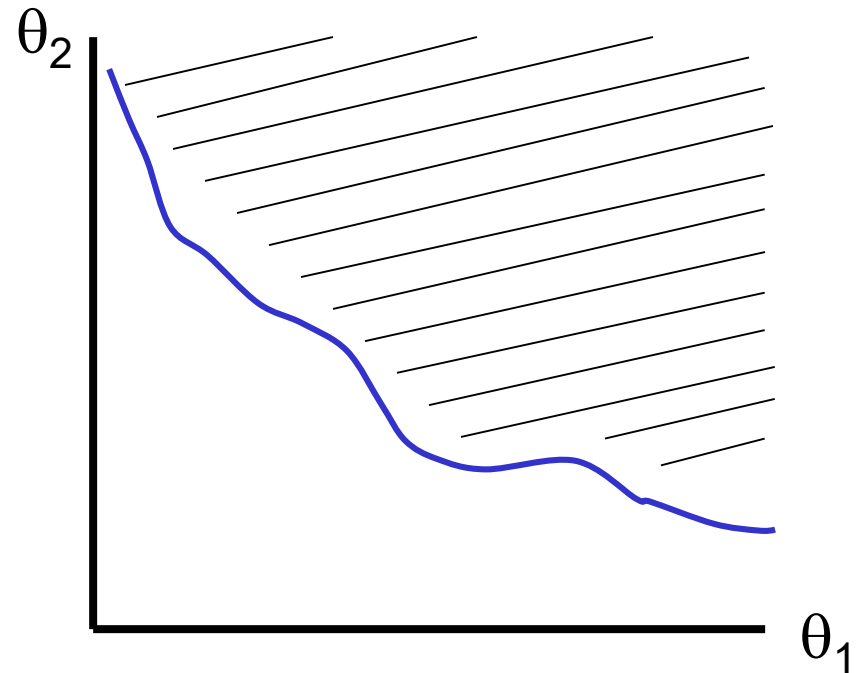


# Parameter Estimation



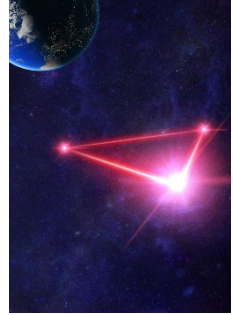
- Define a likelihood comparing the measured spectrum with a model.
- If measurements are upper limits (no SGWB detected), this is easy:
  - » Upper limits on model parameters.
- In case of detection, much more complex:
  - » Which models contribute? Model selection...
  - » One vs more models? How do you set up the likelihood?
  - » Bias if your model is incorrect?
- **Need a statistical framework to deal with this complexity.**

$$\ln L \propto \sum_f \frac{\left( \Omega_d(f) - \Omega_m(f; \vec{\theta}) \right)^2}{\sigma_f^2}$$



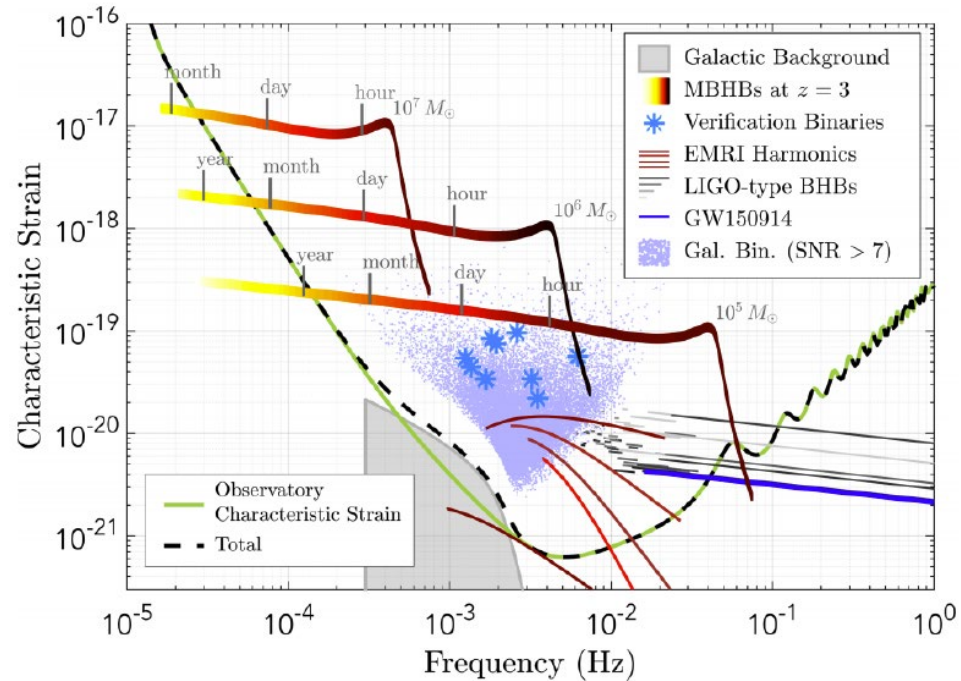


# Challenges



- LISA band is very crowded.
- Many residual sources:
  - » Massive and solar BBH, DWD.
  - » Will these be subtracted before SGWB search is done? How? Residuals?
  - » If not, how does the SGWB search plug in with other searches?
- Galactic DWD foreground:
  - » SGWB, but directional.
  - » Must be included in the SGWB search – otherwise, bias...
  - » Impacts resolvable searches too.
  - » Other directional (e.g. LMC)?

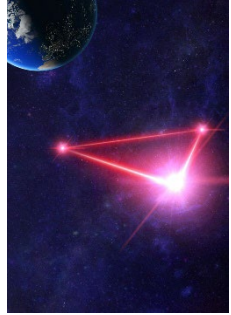
LISA proposal: 1702.00786 (2017)







# Bayesian Formalism



- Directly estimate model parameters from data.
- Naturally combine multiple models.
  - » Including noise model.
  - » Existing infrastructure to handle many-dimensional parameter spaces.
- Naturally combine multiple experiments (eg LISA + 3G).
- Hierarchical formalisms: more complex parameter dependencies.
  - » Physical constraints.
- Model selection: Bayes factors
- Other searches (eg CBC) also use Bayesian formalisms.

Bayes Theorem:

$$P(\vec{\theta} | data) = \frac{P(data | \vec{\theta}) P(\vec{\theta})}{P(data)}$$

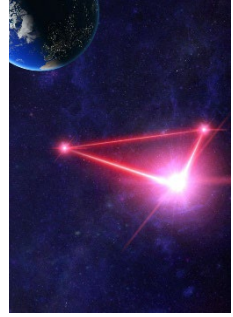
Posterior      Likelihood      Evidence      Prior

Bayes Factor:

$$K = \frac{P(M_1 | data)}{P(M_2 | data)}$$



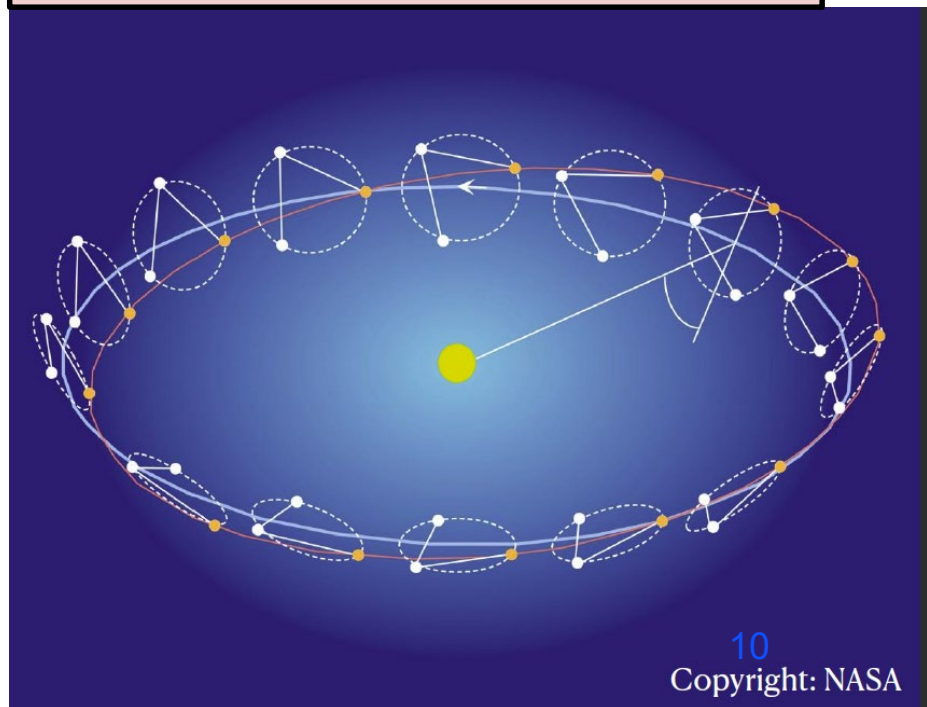
# Bayesian LISA Pipeline (BLIP)



- Independent, python-based LISA SGWB search.
- Features:
  - » Instrumental Gaussian noise.
  - » Stationary and non-stationary LISA detector.
  - » TDI: XYZ and AET
    - Simplified heliocentric rigid body orbits.
  - » Isotropic background, point sources, and spatially extended anisotropy.
  - » Bayesian inference with dynesty and emcee samplers.
  - » Physical constraint: non-negative SGWB across the sky.

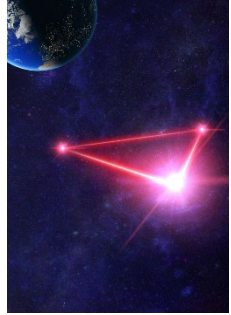
**Sharan Banagiri, Alexander Criswell,**  
T. Kuan, V. Mandic, J. Romano, S. Taylor  
MNRAS 09, 0035 (2021); 2103.00826

Download:  
<https://github.com/sharanbngr/blip>  
pip install blip-gw





# BLIP (2)



- Assume frequency-direction factorization.

» Directional dependence expanded in spherical harmonics.

$$\Omega(f, \hat{n}) = \frac{\Omega(f)}{\sqrt{4\pi a_{00}}} \sum_{lm} a_{lm} Y_{lm}(\hat{n})$$

- Reality:  $a_{l,-m} = (-1)^m a_{l,m}^*$
- Physical:  $\Omega(f, \hat{n}) \geq 0$ 
  - » Essential for Bayesian mapping, especially for highly anisotropic distributions.

- Define another field on 2-sphere:

$$S(\hat{n}) = \sum_{lm} b_{lm} Y_{lm}(\hat{n}) = \left[ \sum_{lm} a_{lm} Y_{lm}(\hat{n}) \right]^{1/2}$$

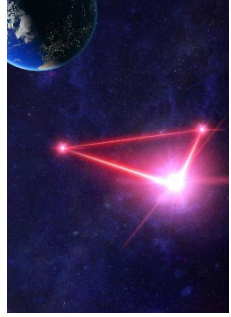
- Non-negative background:

$$b_{l,-m} = (-1)^m b_{l,m}^*$$

- $a_{lm}$ 's and  $b_{lm}$ 's are related through Clebsch-Gordan coefficients.



# BLIP (3)



$$\mathcal{L}(\tilde{d} | N_p, N_a, \Omega_{\text{ref}}, \alpha, \{b_{\ell,m}\}) = \prod_{t,f} \frac{1}{2\pi T_{\text{seg}} |C(t,f)|} \times \exp\left(-\frac{2 \tilde{d}_{t,f}^* C(t,f)^{-1} \tilde{d}_{t,f}}{T_{\text{seg}}}\right)$$

- Assume  $d_I(t) = n_I(t) + h_I(t)$ 
  - » Three channels, split into time-segments, then FFT-ed.
- Compute auto- and cross-correlation terms for all channels.
  - » Populate the covariance matrix  $C$ .
- Covariance matrix is a function of noise and signal parameters.

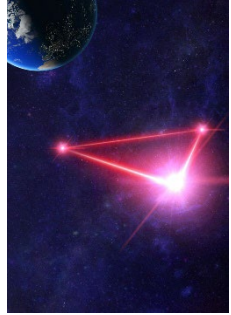
$$S_p(f) = N_p \left[ 1 + \left( \frac{2 \text{ mHz}}{f} \right)^4 \right] \text{ Hz}^{-1},$$

$$S_a(f) = \left[ 1 + \left( \frac{0.4 \text{ mHz}}{f} \right)^2 \right] \left[ 1 + \left( \frac{f}{8 \text{ mHz}} \right)^4 \right] \times \frac{N_a}{(2\pi f)^4} \text{ Hz}^{-1}$$

$$\Omega(f, \hat{n}) = \Omega_{\text{ref}} \left( \frac{f}{f_0} \right)^\alpha \sum_{LM} a_{LM} Y_{LM}(\hat{n})$$

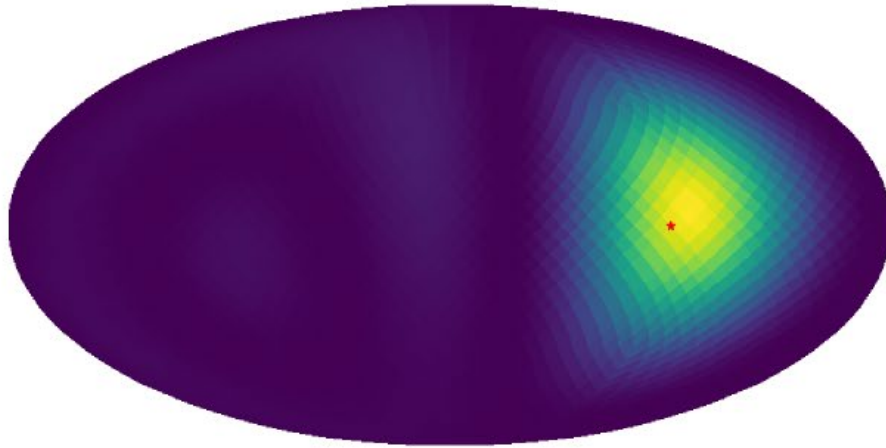
$$a_{L,M} = \sum_{\ell,m} \sum_{\ell',m'} b_{\ell,m} b_{\ell',m'} \beta_{L,M}^{\ell m, \ell' m'}$$

# Recovery of Point Sources



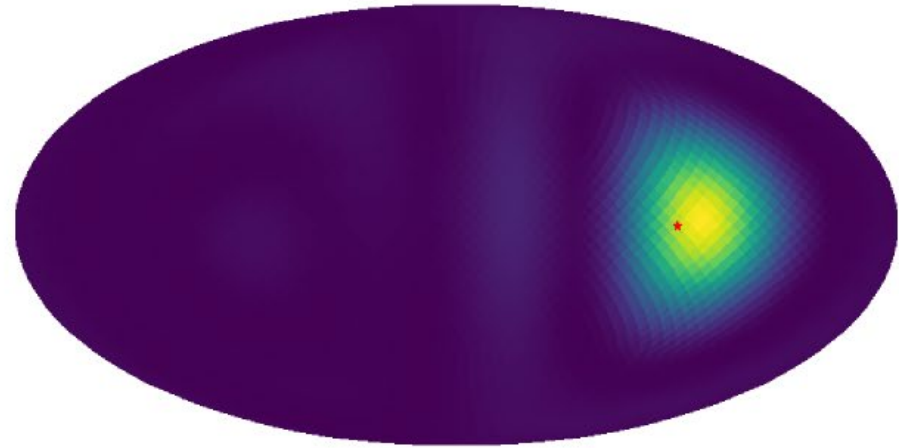
$$l_{max} = 4$$

Posterior predictive skymap of  $\Omega(f = 1\text{mHz})$



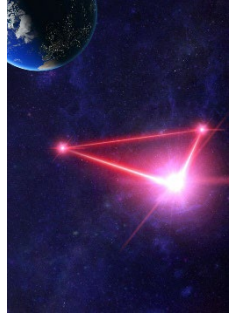
$$l_{max} = 6$$

Posterior predictive skymap of  $\Omega(f = 1\text{mHz})$



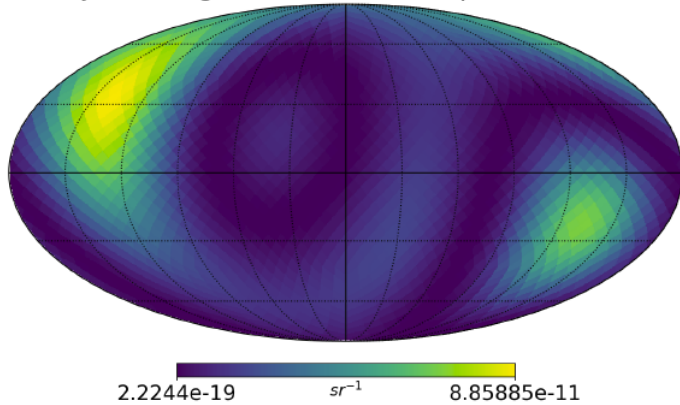
- Recovered sky-maps for simulated point sources.
- 3 months of simulated data.
- Red star indicates the true position of the source.
- Note improved angular resolution when larger  $l_{max}$  is used.

# Recovery of Extended Anisotropy



S. Banagiri

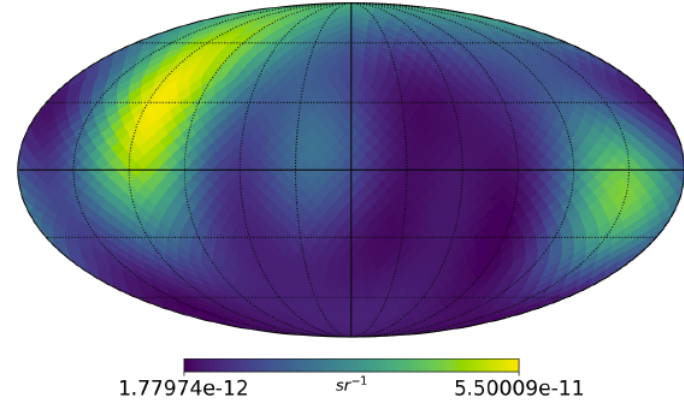
Injected angular distribution map  $\Omega(f = 1\text{mHz})$



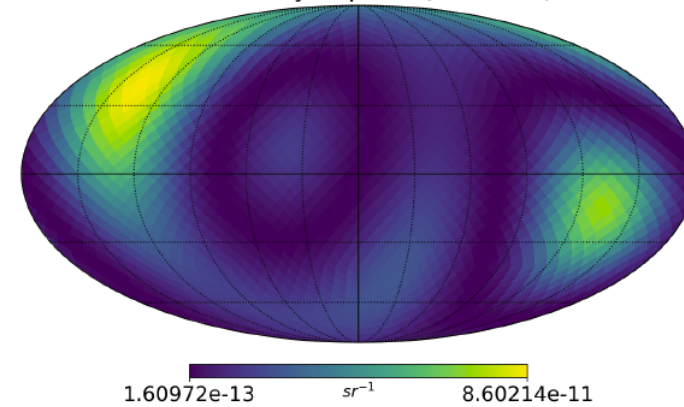
Adhoc power distribution,  $\ell_{\text{max}} = 4$

Two-month analysis

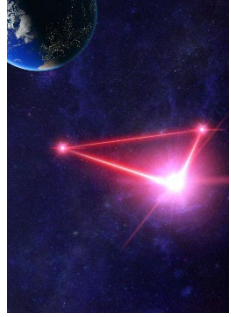
median skymap of  $\Omega(f = 1\text{mHz})$



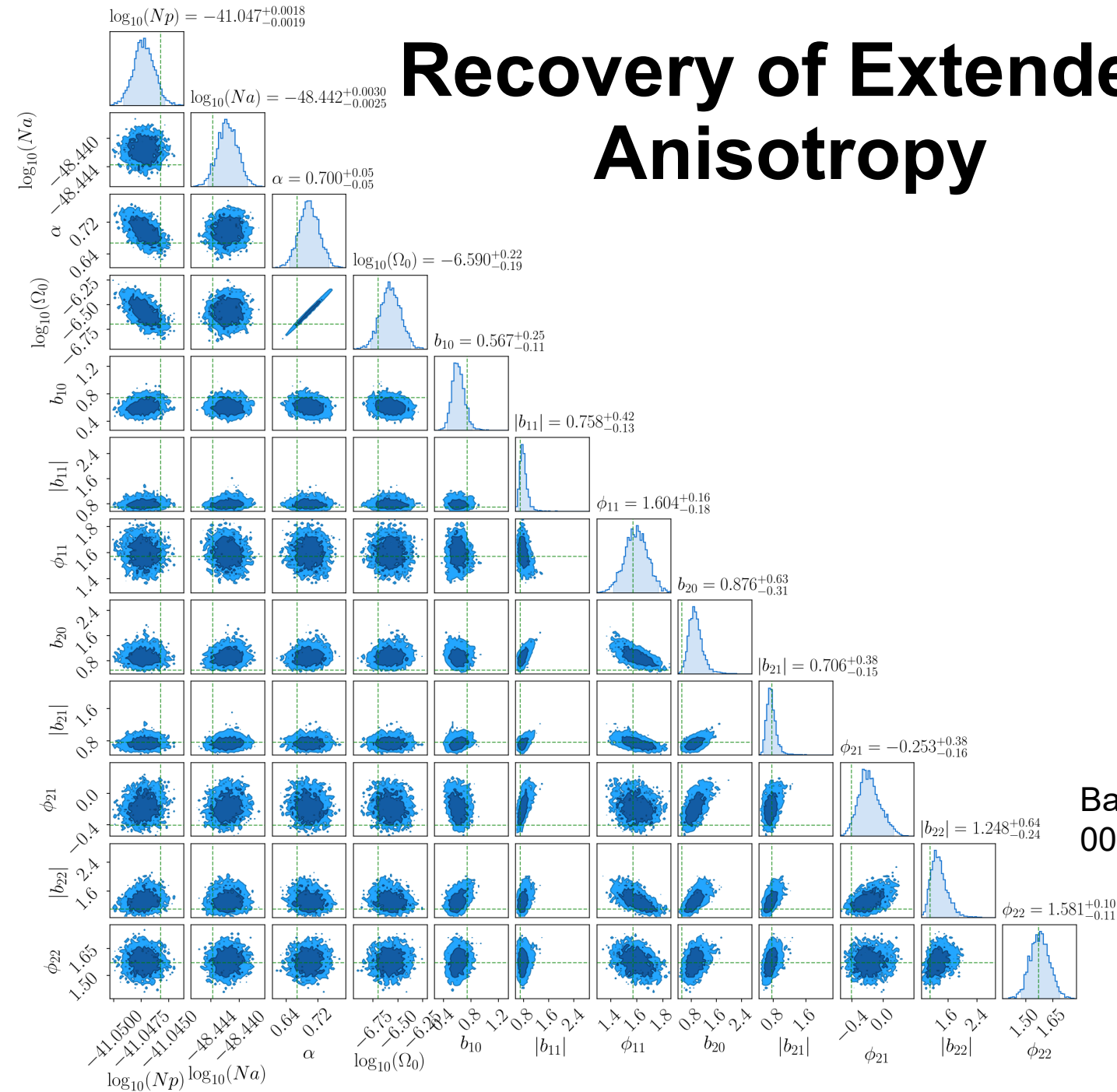
median skymap of  $\Omega(f = 1\text{mHz})$



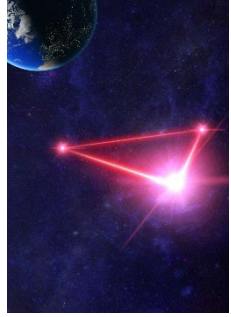
One-year analysis



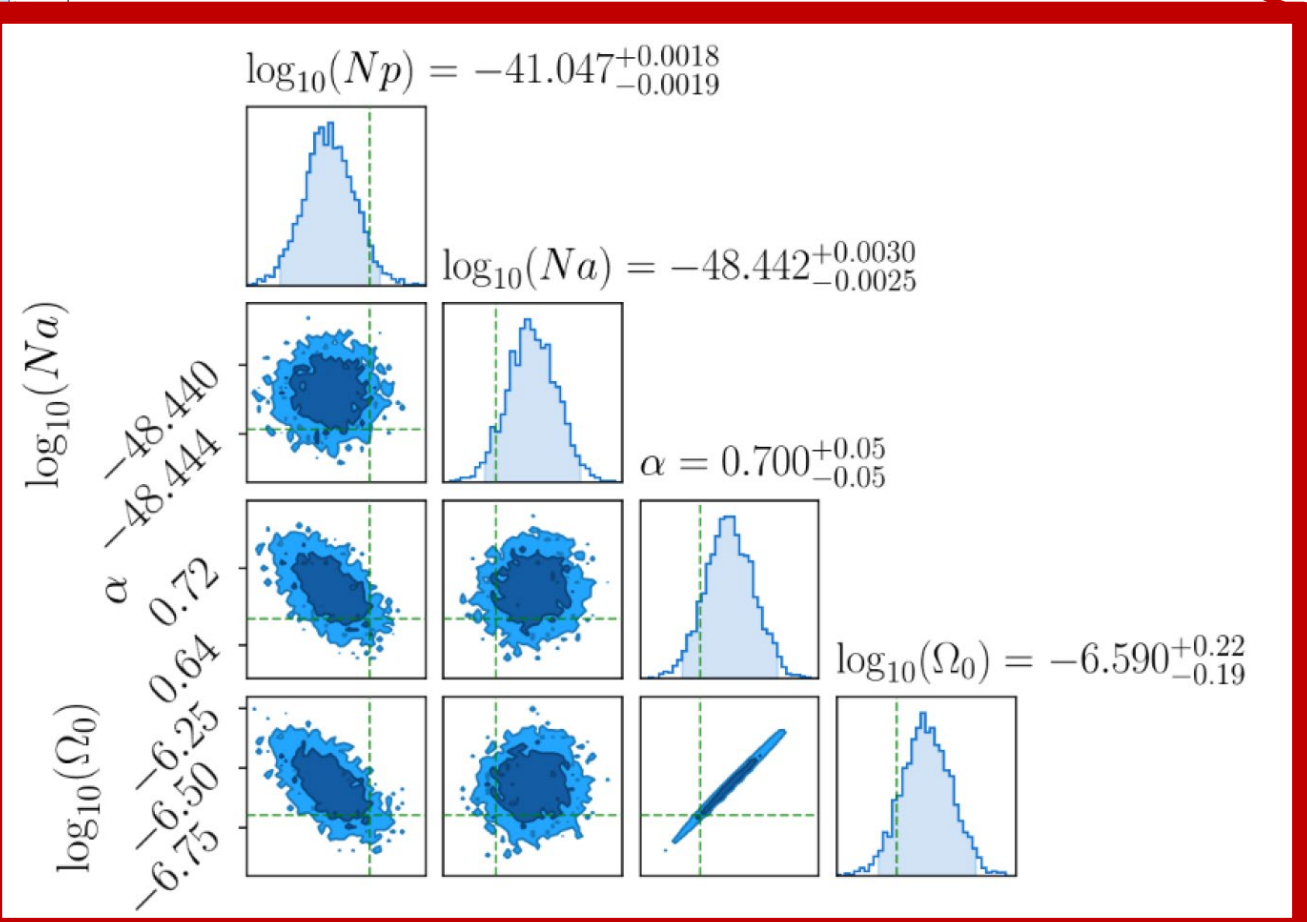
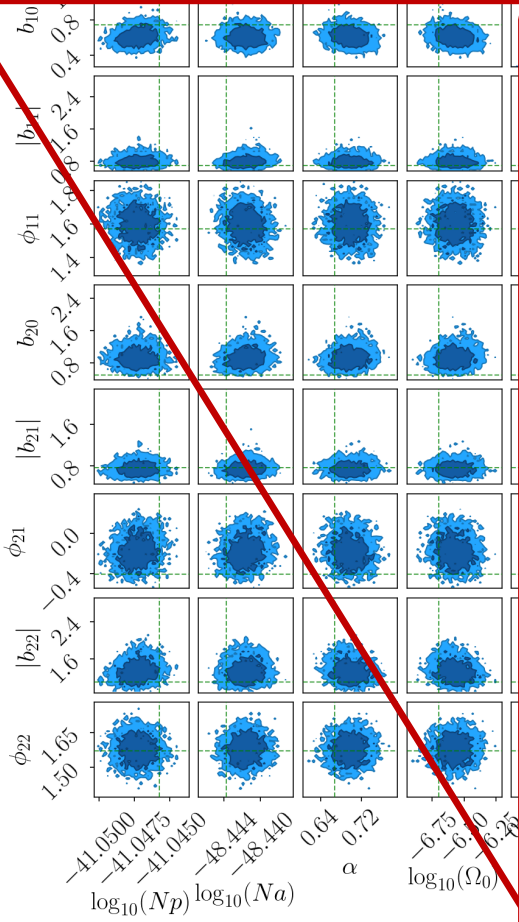
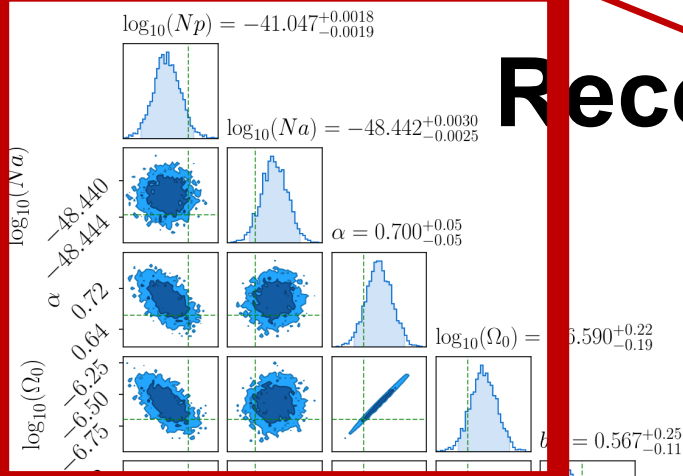
# Recovery of Extended Anisotropy



Banagiri et al, MNRAS 09, 0035 (2021); 2103.00826

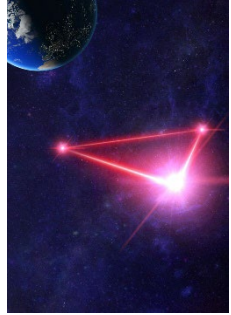


# Recovery of Extended Anisotropy



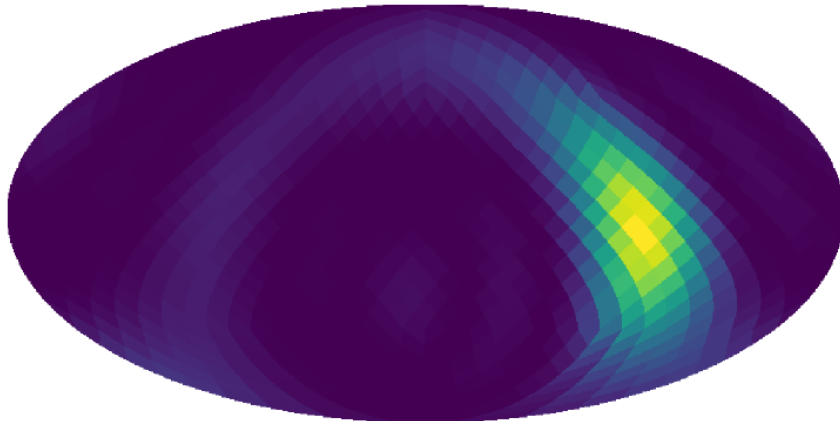


# Recovery of Galactic Foreground



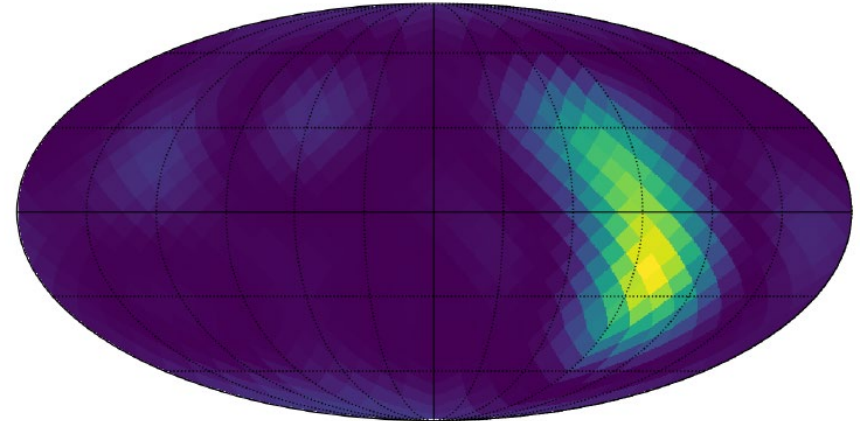
Injected

Injected angular distribution map  $\Omega(f = 1\text{mHz})$



Recovered

median skymap of  $\Omega(f = 1\text{mHz})$

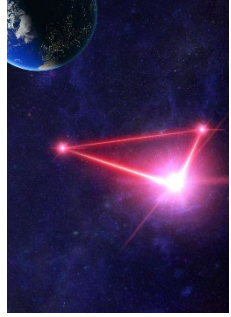


A. Criswell

- Toy model of galactic foreground due to DWD inspirals.
- Power law in frequency,  $\alpha = 2/3$ .
- Disk and Bulge contributions, distributions following Breivik et al (2020) and McMillan (2011).
- $I_{max} = 4$ .



# Conclusions



- Studying accessibility of a model cannot be done independently from other models (astrophysical, cosmological, detector-based).
- Need a unifying statistical framework that can allow:
  - » Searching for (and distinguishing between) multiple models
  - » Isotropic and anisotropic backgrounds
  - » Polarized and unpolarized backgrounds
  - » Instrumental noise and its uncertainty
  - » Perhaps also handle resolved signals
  - » Perhaps also combine with the 3G or pulsar data
- Complex problem, many challenges and biases.
  - » Develop a simulations program to study each of them.
- **Need to start now!**