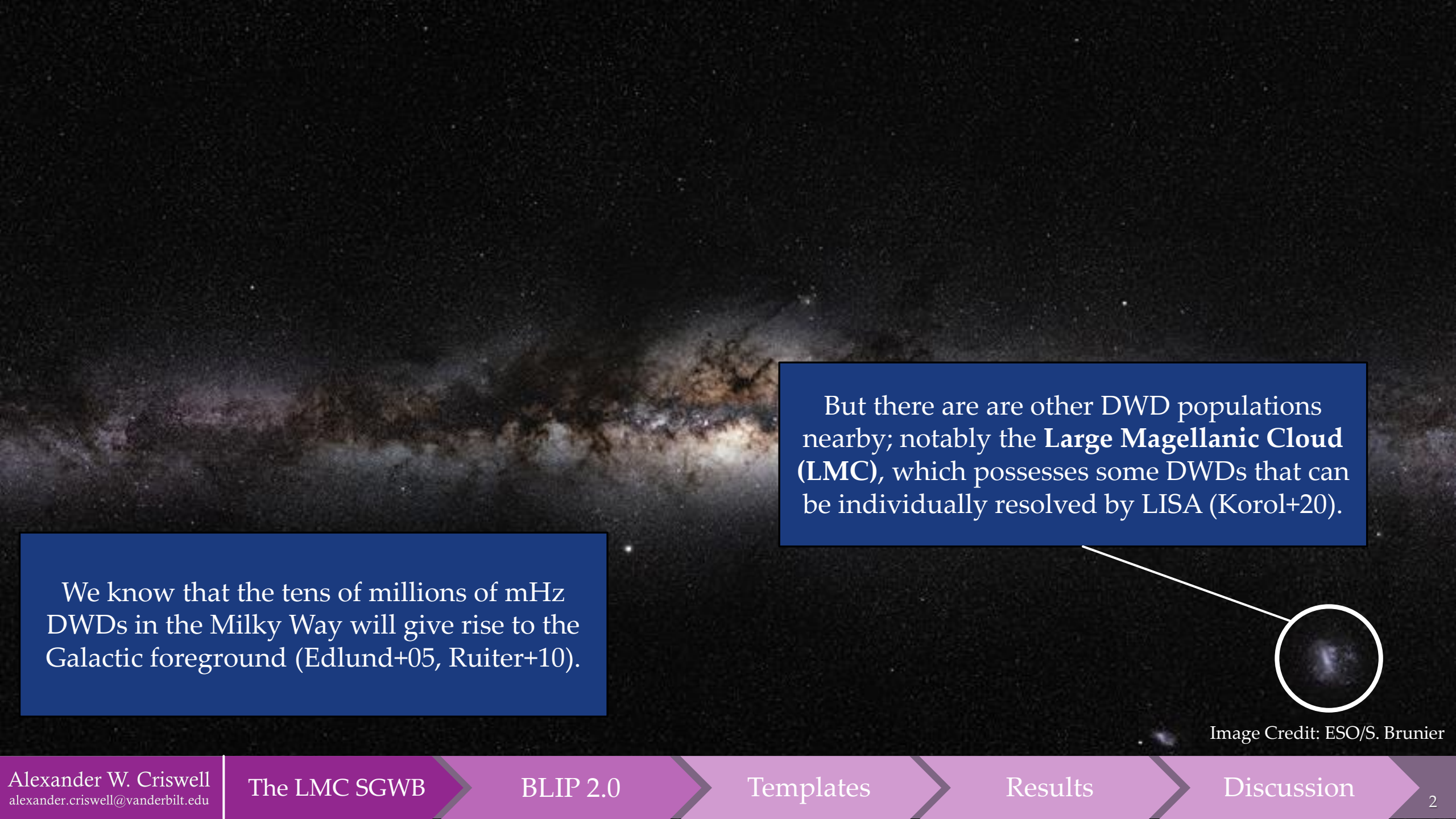


# Spectral Separation of Two Unresolved White Dwarf Binary Populations with LISA

Alexander W. Criswell

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We know that the tens of millions of mHz DWDs in the Milky Way will give rise to the Galactic foreground (Edlund+05, Ruitter+10).

But there are are other DWD populations nearby; notably the **Large Magellanic Cloud (LMC)**, which possesses some DWDs that can be individually resolved by LISA (Korol+20).



Image Credit: ESO/S. Brunier

Question:

Is there a significant SGWB contribution arising from the unresolved LMC DWDs?

Image Credit: ESO/S. Brunier

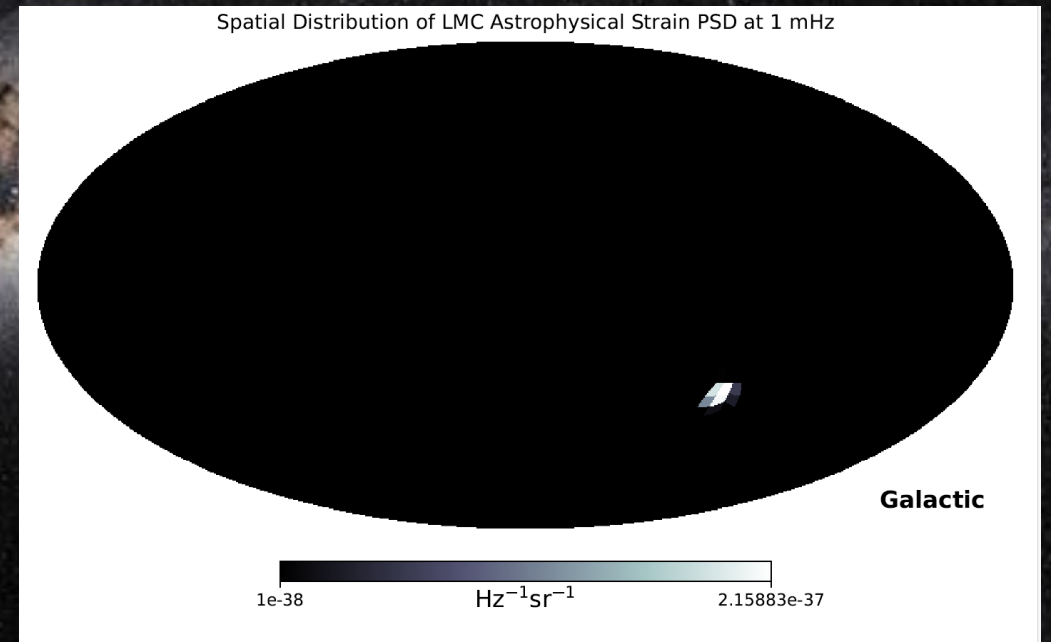
# The LMC SGWB



Steven  
Rieck

Worked with UMN undergraduate (now PhD student @ University of Cincinnati) Steven Rieck, using the DWD population synthesis catalogue of Keim+22, to **establish for the first time** that:

**Yes! There will be a significant SGWB in LISA from the LMC DWDs!**

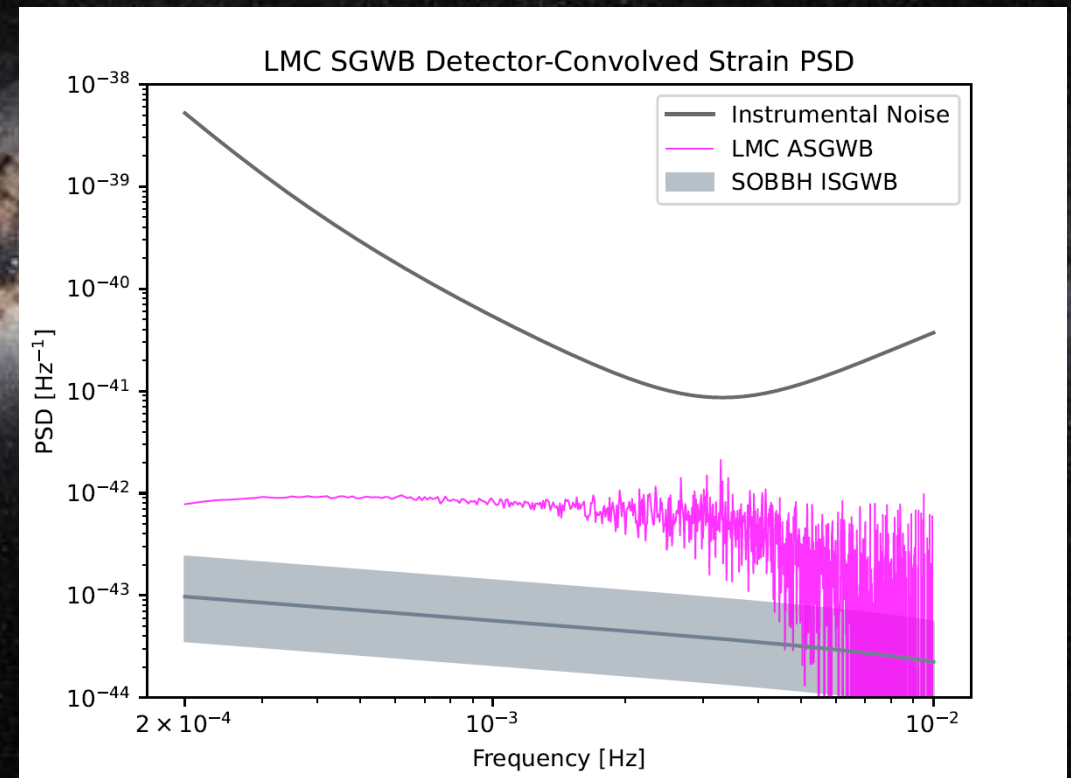


Rieck/AWC+24 (joint first authorship)

Image Credit: ESO/S. Brunier

# The LMC SGWB

Not only that, but the amplitude of the LMC SGWB will be **greater than what is expected for the stellar-origin black hole binary SGWB**



LISA SOBBH SGWB as inferred from GWTC-3 per Babak+23

Image Credit: ESO/S. Brunier

# The LMC SGWB

Properly characterizing the LMC SGWB will likely be crucial for SGWB science with LISA – and gives us another angle with which to learn about this satellite of our Galaxy!

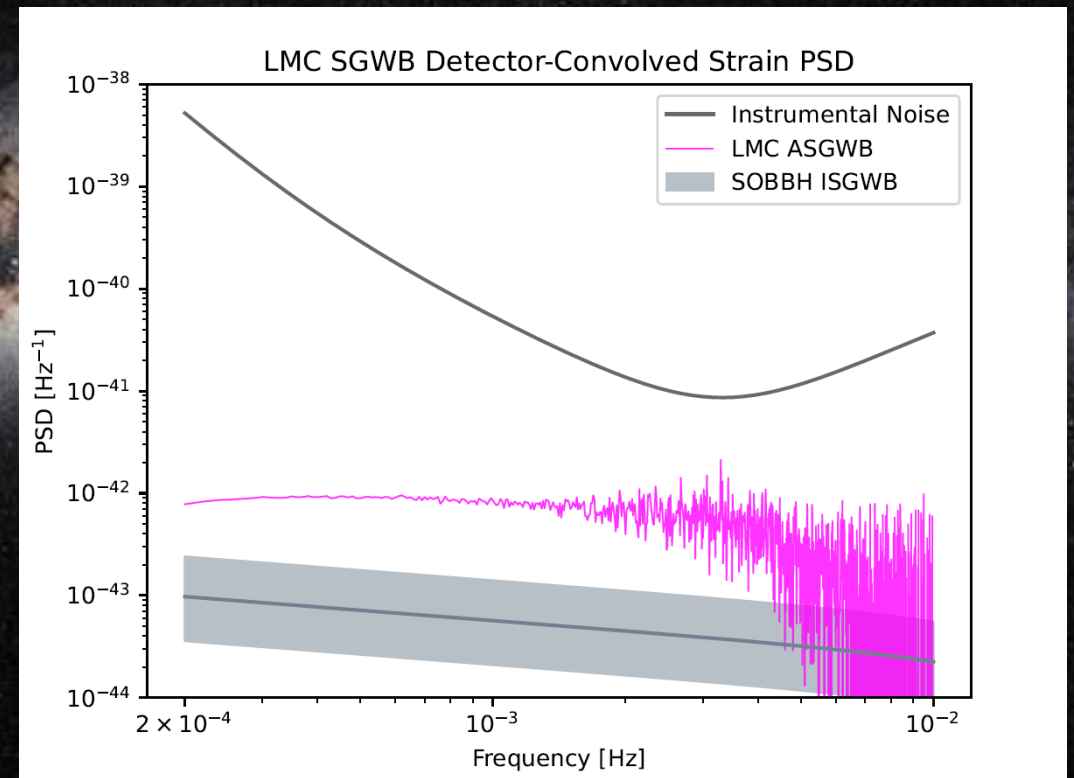


Image Credit: ESO/S. Brunier

# The LMC SGWB

Of course, this depends on being able to separate it from the similar Galactic foreground from the Milky Way's DWD population...

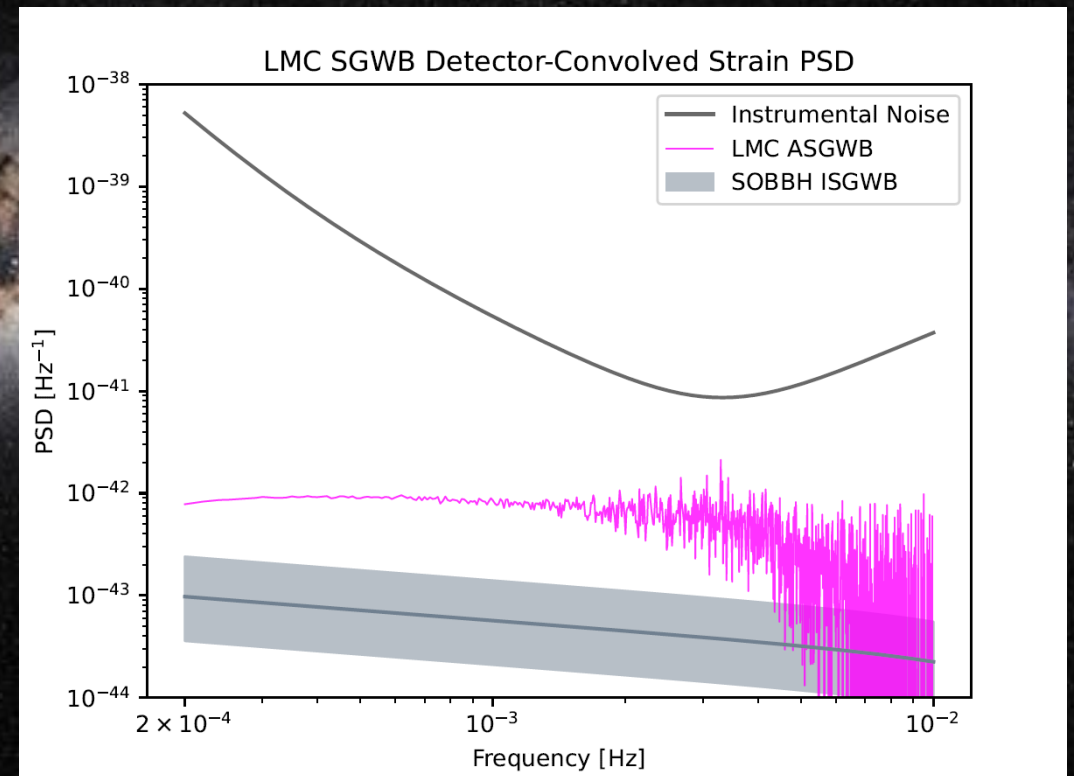


Image Credit: ESO/S. Brunier

# The Bayesian LISA Inference Package (BLIP)

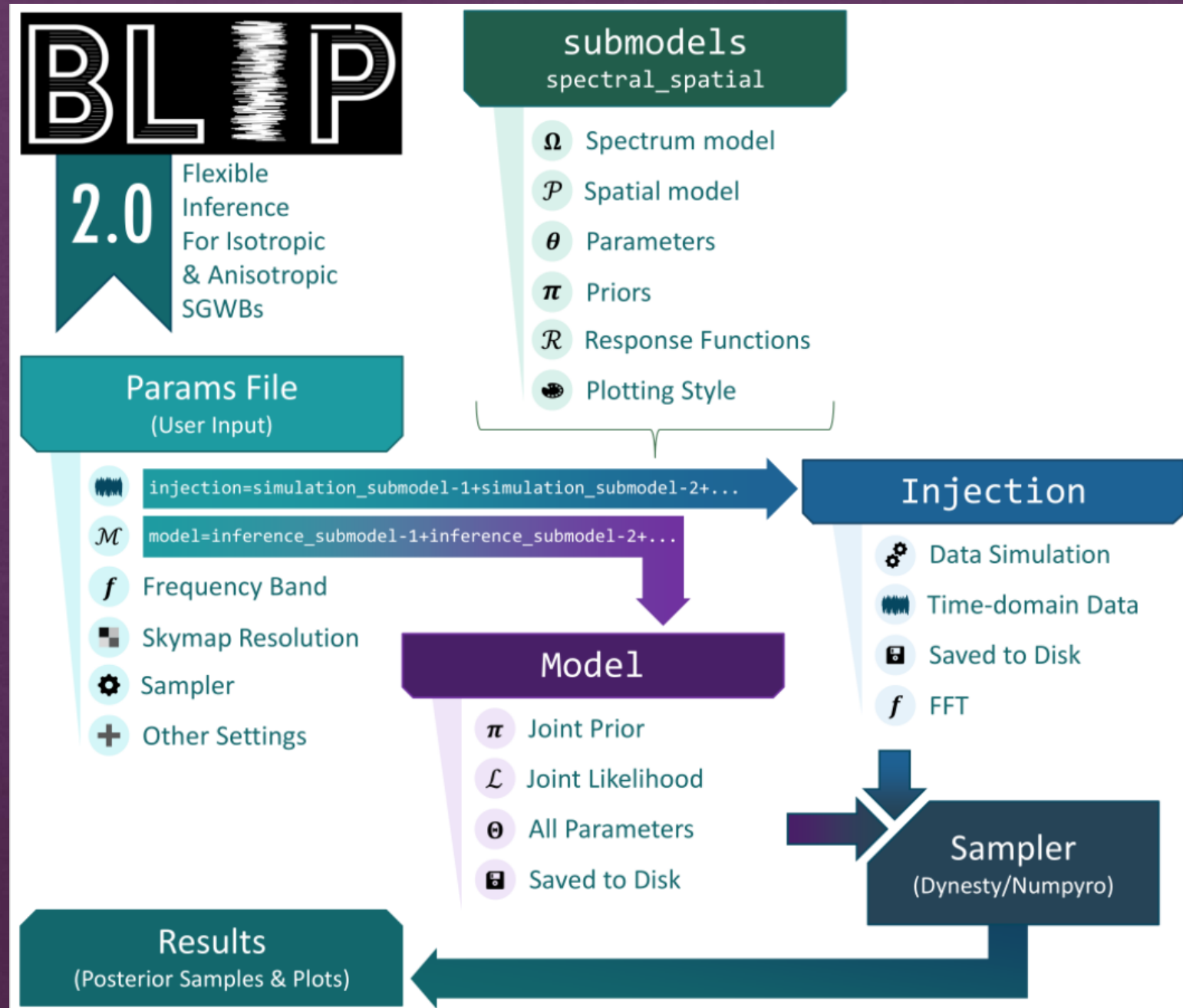
A Python package for simulation and Bayesian inference of isotropic and anisotropic SGWBs in LISA

v1.0: Banagiri, AWC+21; v2.0: AWC+ (in prep)

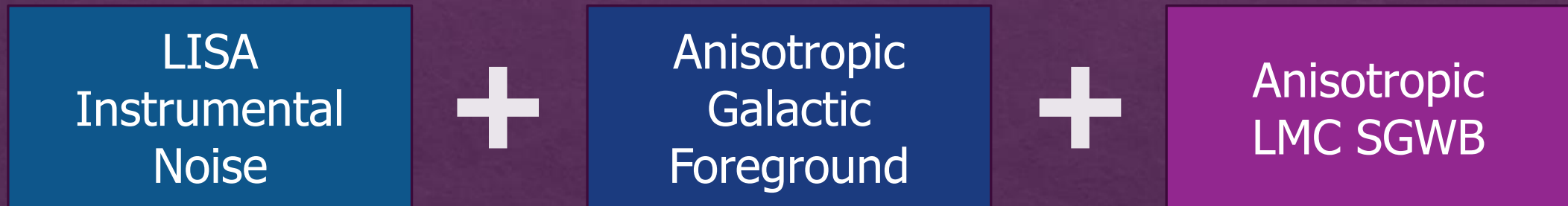


# BLIP 2.0

- Parallelization
- GPU-accelerated sampling
- Dozens of quality-of-life features
- New models
- Pixel basis analyses
- Modular Structure
  - `submodel=spectral+spatial`
- Simultaneous Inference with arbitrary number and combination of SGWBs



# Simultaneous Inference in BLIP 2.0



# Simultaneous Inference in BLIP 2.0

```
model=noise+mwspec_mwtemplate+lmcspec_lmctemplate
```

# Simultaneous Inference in BLIP 2.0

```
model=noise+mwspec_mwtemplate+lmcspec_lmctemplate
```

```
spectral_spatial
```

# spectral\_

model=noise+mwspec\_mwtemplate+lmcspec\_lmctemplate

mwspec – a tanh-truncated power law with astrophysical priors

→ Has a fixed low-frequency slope and priors such that:

$$\Omega_{\text{GW}}(f) = \frac{1}{2} \Omega_{\text{ref}} \left( \frac{f}{f_{\text{ref}}} \right)^{\alpha} \left( 1 + \tanh \left( \frac{f_{\text{cut}} - f}{f_{\text{scale}}} \right) \right)$$

$$\pi(\log \Omega_{\text{ref}}) = \mathcal{U}(-6, -4)$$

$$\pi(\log_{10} f_{\text{cut}}) = \mathcal{U}(-3.1, -2.4)$$

$$\pi(\log_{10} f_{\text{scale}}) = \mathcal{U}(-4, -2)$$

$$\alpha = 2/3$$

# spectral\_

```
model=noise+mwspec_mwtemplate+lmcspec_lmctemplate
```

## lmcspec – a broken power law with astrophysical priors

→ Has a fixed low-frequency slope and priors such that:

$$\Omega_{\text{GW}}(f) = \Omega_{\text{ref}} \left( \frac{f}{f_{\text{ref}}} \right)^{\alpha_1} \left( 1 + \left( \frac{f}{f_{\text{break}}} \right)^{\frac{1}{\delta}} \right)^{\delta(\alpha_1 - \alpha_2)}$$

$$\pi(\log_{10} \Omega_{\text{ref}}) = \mathcal{U}(-12, -8)$$

$$\pi(\alpha_2) = \mathcal{U}(2/3, 8/3)$$

$$\pi(\log_{10} f_{\text{break}}) = \mathcal{U}(-3, -2)$$

$$\pi(\delta) = \mathcal{U}(0.01, 1)$$

$$\alpha_1 = 2/3$$

# noise

```
model=noise+mwspec_mwtemplate+lmcspec_lmctemplate
```

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

LISA Instrumental Noise spectral form as given in Amaro-Seone+17 and reproduced in Banagiri, AWC+21

Note: this is a **simple** model of the LISA instrumental noise. While it is commonly used in the literature at present, more complex treatments are in development and will need to be applied in the future. (See e.g. Littenberg+23, Hartwig23, Bayle+23, Novara+24)

# `_spatial`: Fixed Anisotropic Templates

**Anisotropies change how LISA responds to a SGWB as it moves through its orbit.**

Different anisotropies → Different time-dependencies

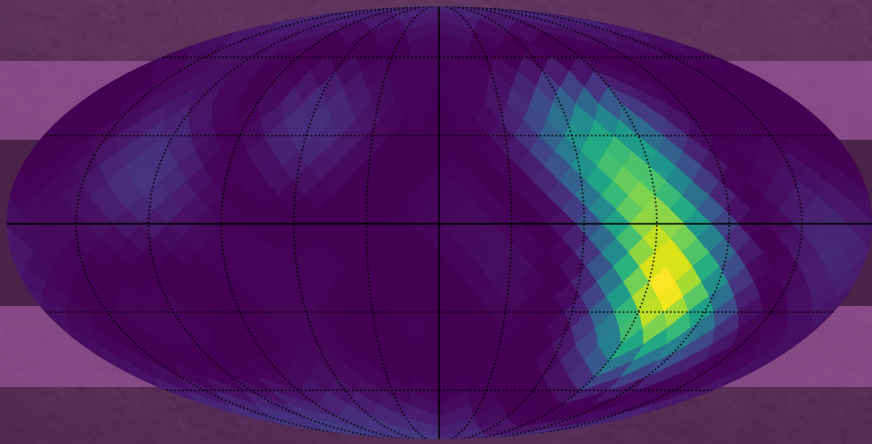
(isotropy → no time-dependence)

Healpix ecliptic projection

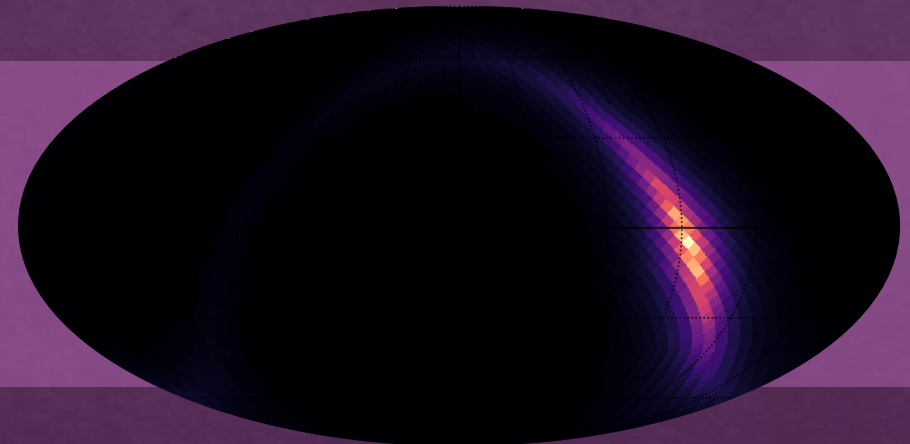


# `_spatial`: Fixed Anisotropic Templates

Spherical Harmonic Basis Recovery



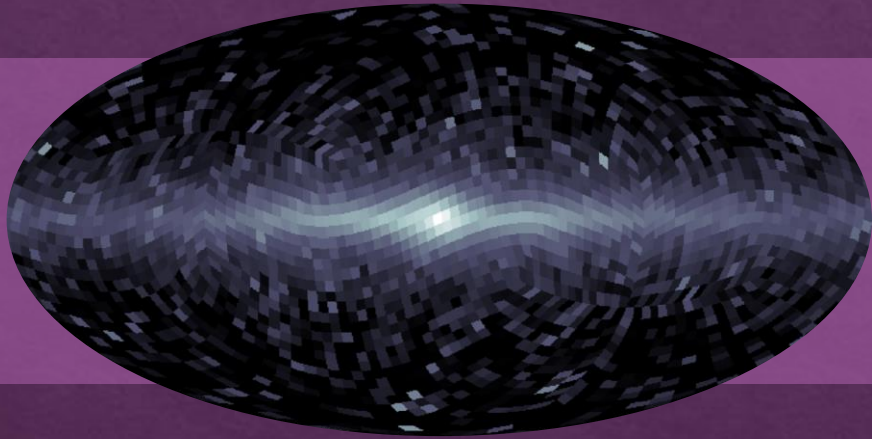
Pixel Basis Template



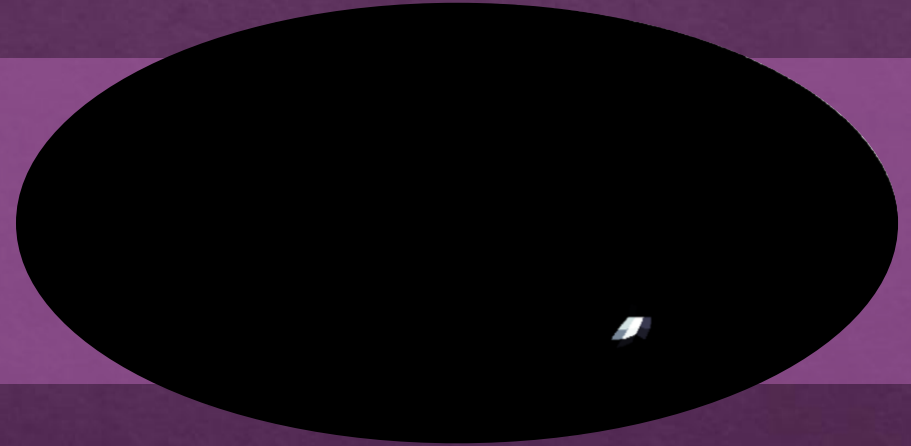
Instead of representing the SGWB spatial distribution on the sky in a spherical harmonic expansion, we do so with a **pixelated skymap** via Healpix (Gorski+05)

# `_spatial`: Fixed Anisotropic Templates

Milky Way  
(`mwtemplate`)



Large Magellanic Cloud  
(`lmctemplate`)



Using MW and LMC population synthesis catalogues, we can create **population-derived anisotropic templates** for both the MW and LMC!

Healpix galactic projection

# Spectral Separation of the LMC SGWB and a Realistic Galactic Foreground

AWC+ in-prep)

Alexander W. Criswell  
alexander.criswell@vanderbilt.edu

The LMC SGWB

BLIP 2.0

Templates

Results

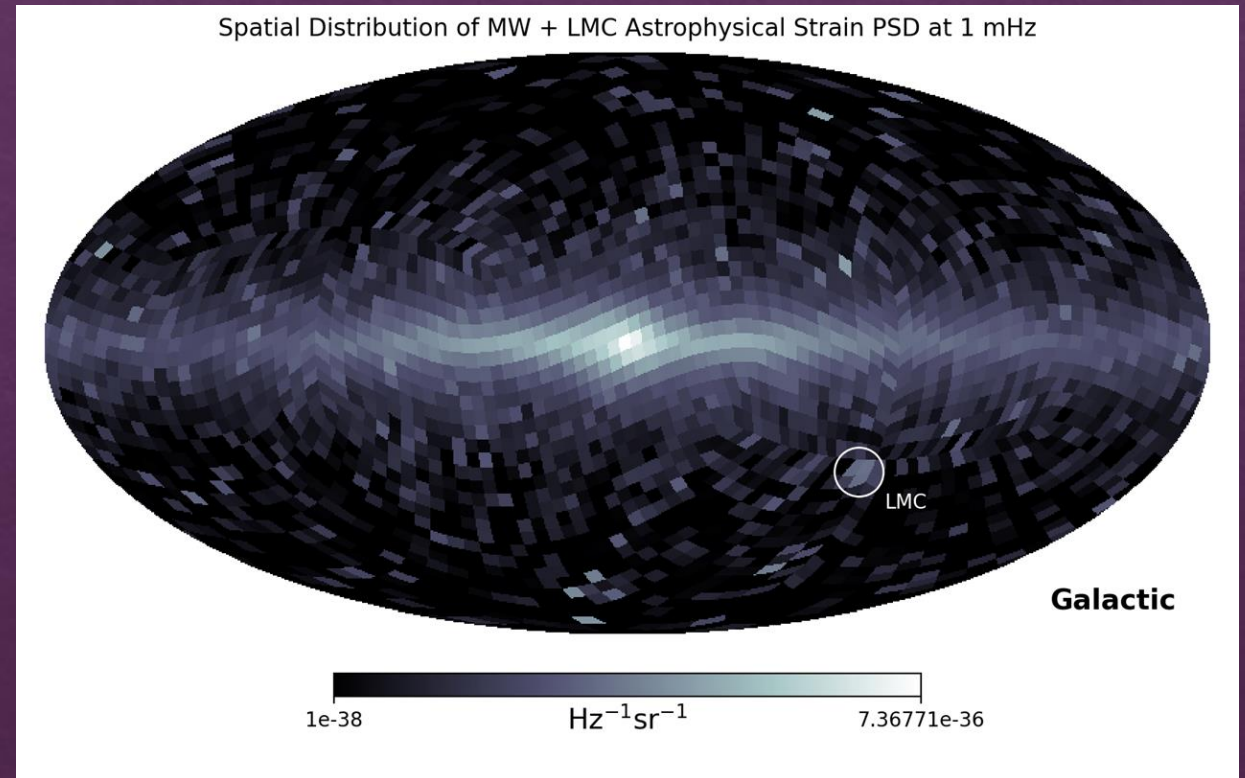
Discussion

# Spectral Separation of the LMC SGWB and a Realistic Galactic Foreground

## Simulation

**Galaxy:** realistic MW DWD population (Wilhelm+20), with SNR>7 binaries removed

**LMC:** realistic LMC DWD population (Keim+22), with SNR>7 binaries removed



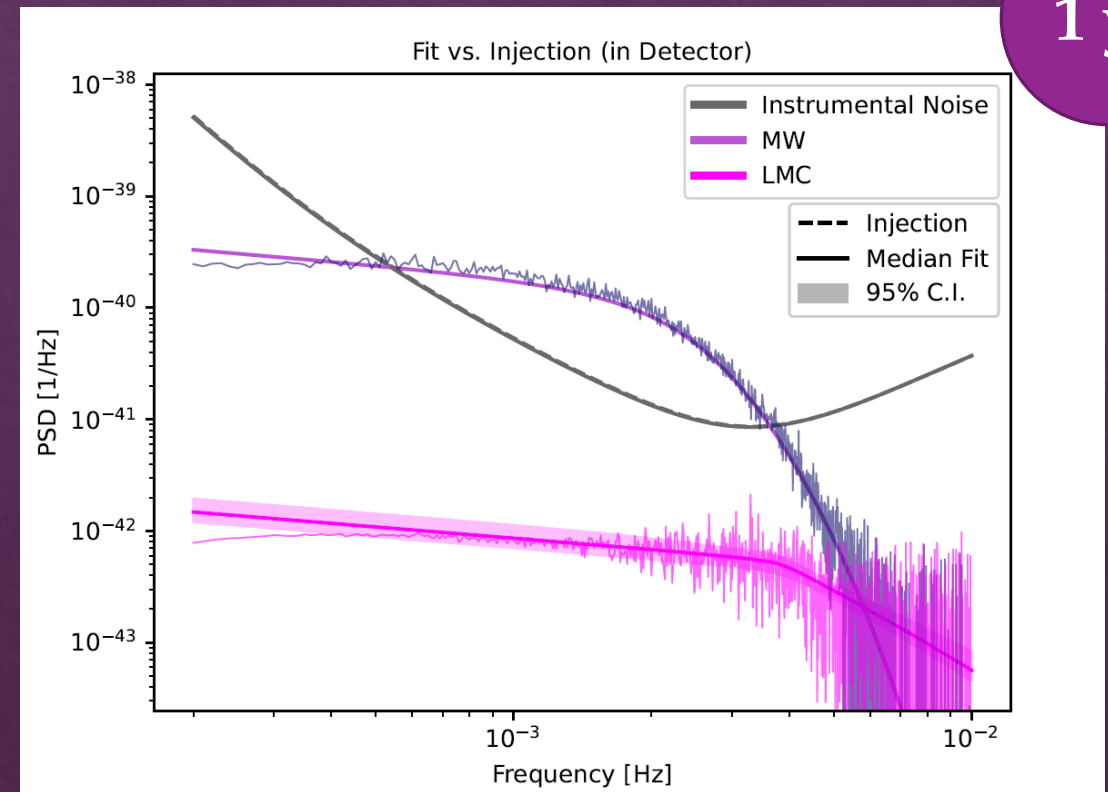
# Spectral Separation of the LMC SGWB and a Realistic Galactic Foreground

Simulation

Galaxy: realistic MW DWD  
Injection (Wilhelm+20), with  
Analysis binaries removed

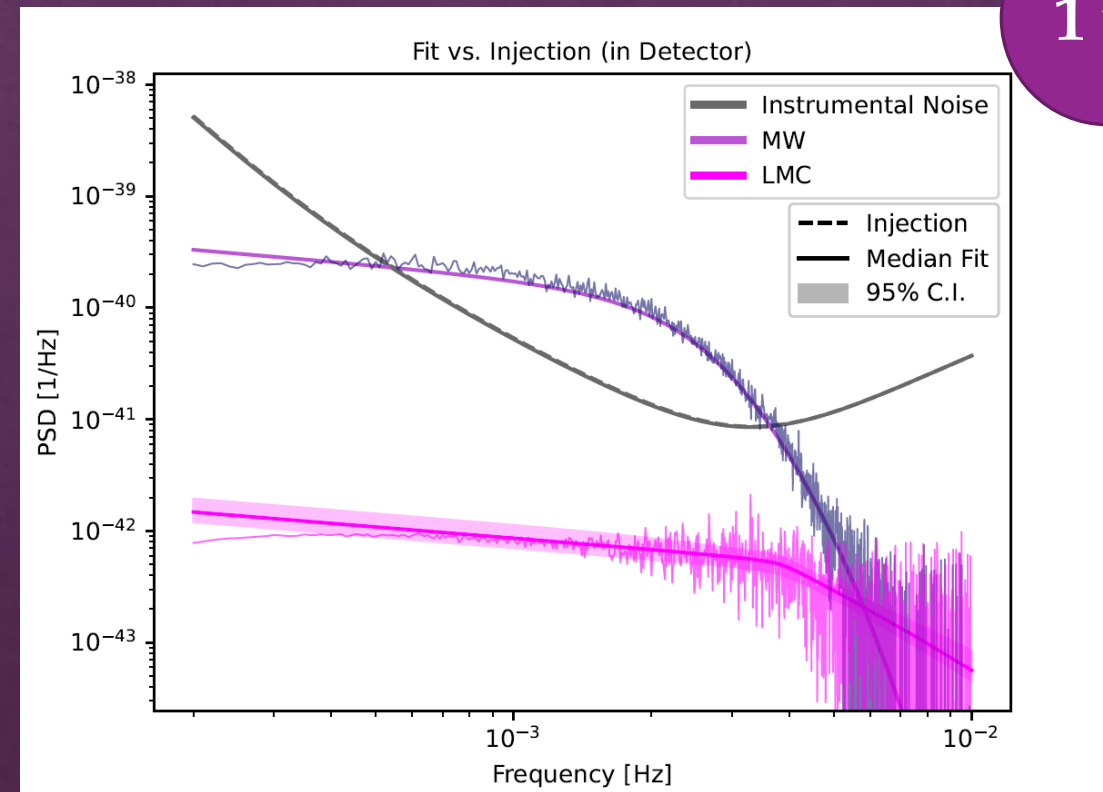
```
model=  
  noise  
  +mwspec_mwtemplate  
  +lmcspec_lmctemplate
```

1 yr



# Spectral Separation of the LMC SGWB and a Realistic Galactic Foreground

This is the **first** demonstration of LISA's potential to perform spectral separation between two unresolved DWD populations' ASGWBs.



1 yr

# Thank you!

# Summary

- The **Large Magellanic Cloud (LMC)** will produce a **significant astrophysical SGWB** in LISA
- **BLIP 2.0** is capable of performing flexible inference on any combination of isotropic and anisotropic SGWB in LISA
- **Templated anisotropic analyses** are powerful tools for **spectral separation**
- I have demonstrated a prototype analysis that can **separate** the LMC SGWB from the Galactic foreground
- This is the first demonstration of spectral separation between two unresolved white dwarf binary populations in LISA



# Extra Slides

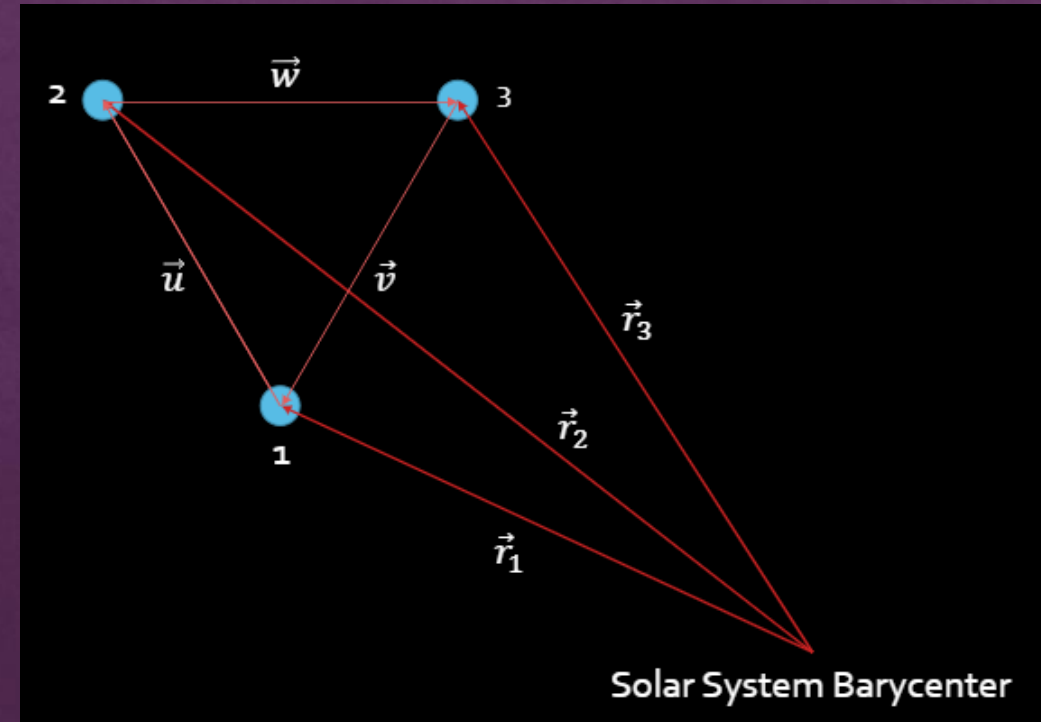
# Time-dependent LISA Response Functions

$$D_I(f, t, \hat{n}) = \frac{1}{2} ((\hat{u} \otimes \hat{u})\mathcal{T}(f, \hat{u} \cdot \hat{n}) - (\hat{v} \otimes \hat{v})\mathcal{T}(f, \hat{v} \cdot \hat{n})) \exp\left(2\pi i f \frac{\hat{n} \cdot \vec{r}_1}{c}\right),$$

$$\mathcal{T}(f, \hat{u} \cdot \hat{n}) = \frac{1}{2} \left[ \text{sinc}\left(\frac{f}{2f_*}(1 - \hat{n} \cdot \hat{u})\right) \exp\left(-i\frac{f}{2f_*}(3 + \hat{n} \cdot \hat{u})\right) + \text{sinc}\left(\frac{f}{2f_*}(1 + \hat{n} \cdot \hat{u})\right) \exp\left(-i\frac{f}{2f_*}(1 + \hat{n} \cdot \hat{u})\right) \right],$$

$$F_I^A(f, t, \hat{n}) = D_I(f, t, \hat{n}) : e^A(\hat{n}).$$

$$\mathcal{R}_{IJ}(t, f | \vec{\theta}_S) = \frac{1}{2} \int \mathcal{P}(\hat{n} | \vec{\theta}_S) \left( \sum_A F_I^A(f, t, \hat{n}) F_J^{A*}(f, t, \hat{n}) \right) d^2n.$$



Cornish & Larson 10, Romano & Cornish 17

# The BLIP Spherical Harmonic ASGWB Search

Infers the coefficients of a spherical harmonic expansion of the **square root of the power on the sky**

→ Mathematically ensures that the inferred power will be **real and non-negative in every direction.**



Sharan Banagiri

Post-doc at  
Monash

Note: this is a generic search, well-suited to ASGWBs where the spatial distribution is not known *a priori*

# The BLIP Spherical Harmonic ASGWB Search

$$\Omega_{\text{GW}}(f, \mathbf{n}) = \Omega(f)\mathcal{P}(\mathbf{n}).$$

Assume frequency and spatial dependence are separable (expected!)



Sharan Banagiri

Post-doc at  
Northwestern

# The BLIP Spherical Harmonic ASGWB Search

$$\Omega_{\text{GW}}(f, \mathbf{n}) = \Omega(f)\mathcal{P}(\mathbf{n}).$$

Assume frequency and spatial dependence are separable (expected!)

$$\mathcal{P}(\mathbf{n}) = \frac{1}{\sqrt{4\pi a_{0,0}}} \sum_{\ell,m} a_{\ell,m} Y_{\ell,m}(\mathbf{n}),$$

Standard spherical harmonic expansion of GW power on the sky. But  $\mathcal{P}(\mathbf{n})$  must be non-negative everywhere on the sky...

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Applying this condition while sampling is **computationally expensive** and **ultimately ineffective!**

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Standard spherical harmonic expansion of GW power on the sky. But  $\mathcal{P}(\mathbf{n})$  must be non-negative everywhere on the sky...

$$\mathcal{S}(\mathbf{n}) = \left[ \sum_{\ell,m} a_{\ell,m} Y_{\ell,m}(\mathbf{n}) \right]^{1/2} = \sum_{\ell,m} b_{\ell,m} Y_{\ell,m}(\mathbf{n}).$$

Defining  $\mathcal{S}(\mathbf{n})$  as the square root of the spherical harmonic expansion fulfills this condition as long as  $\mathcal{S}(\mathbf{n})$  is real – or, equivalently,  $b_{l,-m} = (-1)^m b_{l,m}^*$

Applying this condition while sampling is **computationally expensive** and **ultimately ineffective!**

# The BLIP Spherical Harmonic ASGWB Search

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$$\sum_{L,M} a_{L,M} Y_{L,M} = \left( \sum_{\ell,m} b_{\ell,m} Y_{\ell,m}(\mathbf{n}) \right)^2$$

We can then infer each  $b_{l,m}$  up to some desired  $l_{\text{max}}^b = 1/2 l_{\text{max}}^a$ , quickly liaising between our  $b_{l,m}$  parameterization and the power on the sky in the  $a_{l,m}$ s via **Clebsch-Gordon coefficients**



# Clebsch-Gordon Expansion

$$\sum_{L,M} a_{L,M} Y_{L,M} = \left( \sum_{\ell,m} b_{\ell,m} Y_{\ell,m}(\mathbf{n}) \right)^2.$$

$$\sum_{L,M} a_{L,M} Y_{L,M} = \sum_{\ell,m} \sum_{\ell',m'} b_{\ell,m} b_{\ell',m'} Y_{\ell,m}(\mathbf{n}) Y_{\ell',m'}(\mathbf{n}).$$

$$Y_{\ell,m}(\mathbf{n}) Y_{\ell',m'}(\mathbf{n}) = \sum_{L=L_{\min}}^{L_{\max}} \sqrt{\frac{(2\ell+1)(2\ell'+1)}{4\pi(2L+1)}} \times C_{\ell m, \ell' m'}^{LM} C_{\ell 0, \ell' 0}^{L0} Y_{L,M}(\mathbf{n}).$$

$$\sum_{L,M} a_{L,M} Y_{L,M}(\mathbf{n}) = \sum_{L,M} \left( \sum_{\ell m} \sum_{\ell' m'} b_{\ell,m} b_{\ell',m'} \beta_{L,M}^{\ell m, \ell' m'} \right) \times Y_{L,M}(\mathbf{n}).$$

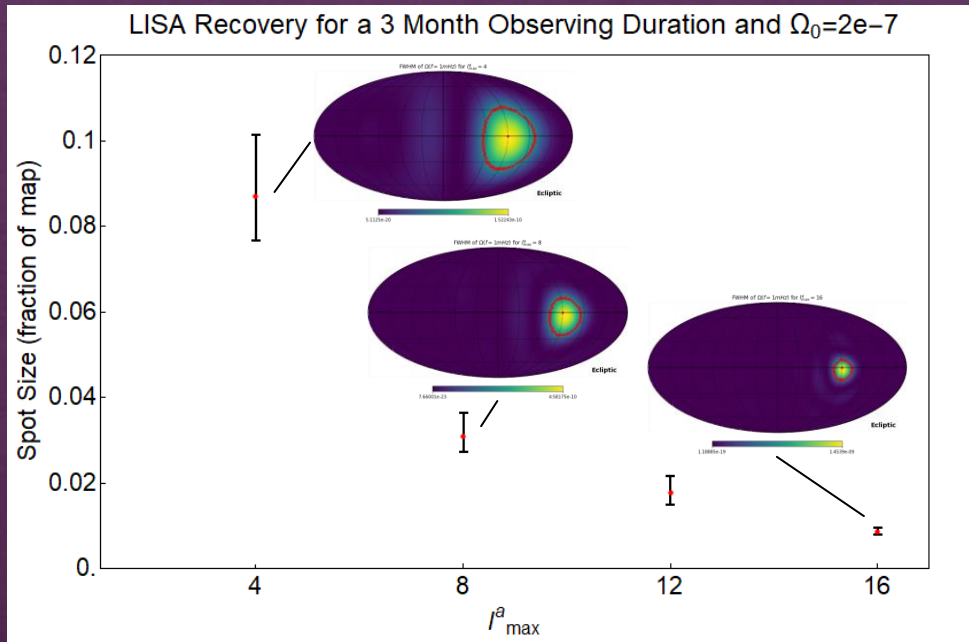
- $M = m + m'$
- $L_{\min} = \min(|\ell - \ell'|, |m + m'|)$  and  $L_{\max} = \ell + \ell'$
- $L$  is an integer

For compactness, let us define  $\beta_{\ell m, \ell' m'}^{L,M}$  such that:

$$\beta_{\ell m, \ell' m'}^{L,M} = \sqrt{\frac{(2\ell+1)(2\ell'+1)}{4\pi(2L+1)}} C_{\ell m, \ell' m'}^{LM} C_{\ell 0, \ell' 0}^{L0}, \quad (3.7)$$

when the selection rules are satisfied, but  $\beta_{\ell m, \ell' m'}^{L,M} = 0$  otherwise.

# Angular Resolution of the BLIP Spherical Harmonic ASGWB Analysis



Highest angular resolution achieved **exceeded the resolution of other, non-Bayesian ASGWB analyses** for similar signals ( $l_{\max}^a = 16$  vs.  $l_{\max}^a \leq 15$  for Contaldi+20\*).

\* Also surpassing Kudoh+05,  
Taruya+05, Breivik+20.

Bloom, AWC+(in-prep)

Alexander W. Criswell  
ander.criswell@vanderbilt

Extra Slides

# Original BLIP Likelihood

One SGWB signal + LISA instrumental noise

$$\mathcal{L} = \prod_{t,f} \frac{1}{2\pi T_{\text{seg}} \det \left( C_{IJ}^M(t, f | \vec{\theta}) \right)} \exp \left[ -\frac{2}{T_{\text{seg}}} \sum_{I,J} \tilde{d}_I^*(t, f) \left( C_{IJ}^M(t, f | \vec{\theta}) \right)^{-1} \tilde{d}_J(t, f) \right]$$

BLIP Fourier-domain likelihood (Banagiri, AWC+21),  
based on the multi-dimensional complex Gaussian  
likelihood of Adams& Cornish 2010

# Original BLIP Likelihood

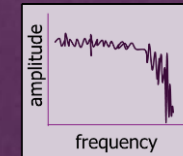
One SGWB signal + LISA instrumental noise

$$\mathcal{L} = \prod_{t,f} \frac{1}{2\pi T_{\text{seg}} \det \left( C_{IJ}^M(t, f | \vec{\theta}) \right)} \exp \left[ -\frac{2}{T_{\text{seg}}} \sum_{I,J} \tilde{d}_I^*(t, f) \left( C_{IJ}^M(t, f | \vec{\theta}) \right)^{-1} \tilde{d}_J(t, f) \right]$$

BLIP Fourier-domain likelihood (Banagiri, AWC+21),  
based on the multi-dimensional complex Gaussian  
likelihood of Adams & Cornish 2010

# Modelling the Induced Covariance

$$C_{IJ}^M(t, f | \vec{\theta}) = S_{IJ}^n(f | \vec{\theta}_n) + \mathcal{R}_{IJ}(t, f | \vec{\theta}_S) S_{GW}(f | \vec{\theta}_f)$$



**Spectral dependence**

$$S_{IJ}^n(f | \vec{\theta}_n)$$

LISA instrumental  
noise PSD

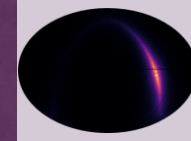
$$S_{GW}(f | \vec{\theta}_f)$$

The SGWB PSD

PSD: Power Spectral Density

# Impact of Anisotropies

$$C_{IJ}^M(t, f | \vec{\theta}) = S_{IJ}^n(f | \vec{\theta}_n) + \mathcal{R}_{IJ}(t, f | \vec{\theta}_S) S_{GW}(f | \vec{\theta}_f)$$



**Spatial** dependence

$$\mathcal{R}_{IJ}(t, f | \vec{\theta}_S)$$

Time-dependent  
LISA response

$$= \int \mathcal{P}(\hat{n} | \vec{\theta}_S) \mathcal{R}_{IJ}(t, f, \hat{n}) d^2n$$

i.e., the effects of **detector geometry** convolved with the **model skymap**  $\mathcal{P}(\hat{n} | \vec{\theta}_S)$

PSD: Power Spectral Density

# Simultaneous Inference Formalism

Arbitrary number and combination of SGWB signals + LISA instrumental noise

$$\mathcal{L}_{\text{SI}} = \prod_{t,f} \left[ \frac{1}{2\pi T_{\text{seg}} \det \left( C_{IJ}^{\text{SI}}(t, f | M_{1\dots N}; \vec{\theta}) \right)} \times \exp \left[ -\frac{2}{T_{\text{seg}}} \sum_{I,J} \tilde{d}_I^*(t, f) \left( C_{IJ}^{\text{SI}}(t, f | M_{1\dots N}; \vec{\theta}) \right)^{-1} \tilde{d}_J(t, f) \right] \right]$$

Extension of the BLIP likelihood to multiple SGWBs: the simultaneous inference covariance  $C_{IJ}^{\text{SI}}$  will be the **sum of all component covariances.**

$$C_{IJ}^{\text{SI}}(t, f | M_{1\dots N}; \vec{\theta}) = \sum_{k=1}^N C_{IJ}^{M_k}(t, f | \vec{\theta}_k)$$

# Simultaneous Inference Formalism

Arbitrary number and combination of SGWB signals + LISA instrumental noise

$$p(\vec{\theta}|d) \propto \mathcal{L}(d|C(M_{1\dots k}; \vec{\theta}))\pi(\vec{\theta})$$

Extension of the BLIP likelihood to multiple SGWBs with respective SGWB models  $M_k$  for  $k \in [1 \dots N]$  with parameters  $\vec{\theta}_k$ . The total covariance will be the **sum of all model covariances**:

$$C_{\text{total}}(M_{1\dots k}; \vec{\theta}) = C_{\text{noise}}(\vec{\theta}_{\text{noise}}) + \sum_{k=1}^N C_k(\vec{\theta}_k)$$



# An Aside on Spectral Representations

$$S_{\text{GW}}(f|\vec{\theta}_f)$$

The SGWB PSD

&

$$\Omega_{\text{GW}}(f|\vec{\theta}_f)$$

The dimensionless  
GW energy density

are related by

$$\Omega_{\text{GW}}(f) = \frac{2\pi^2}{3H_0^2} f^3 S_{\text{GW}}(f).$$

PSD: Power Spectral Density