# Spectral separation of the stochastic background for LISA

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Context: Stochastic background In USA paper of BBH/BNS prediction MCMC: Markov chains Monte Carlo Fisher Information Matrix. Results 6 parameter A-MCMC Orbital Modulati

» Overview

Context: Stochastic background In LISA paper of BBH/BNS prediction MCMC: Markov chains Monte Carlo Results 6 parameter A-MCMC Correlation in LISA PathFinder (LPF) and LISA noise

#### Context: Stochastic background In LISA paper of BBH/BNS prediction

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» Context: Stochastic background In LISA paper of BBH/BNS prediction

Stochastic Background : Superposition of a large number of independent sources (unresolved sources):

 White dwarfs binaries in our galaxy Lamberts *et al.* simulation of the Waveform with galactic population of Double White Dwarf (DWD)

 $\begin{aligned} s(t) &= \sum_{i=1}^{N} \sum_{\mathcal{P}=+,\times} h_{\mathcal{P},i}(f_{orb,i}, \mathcal{M}1_i, \mathcal{M}2_i, X_i, Y_i, Z_i, t) \times \\ F_{\mathcal{P}}(\theta, \phi, t) \mathbf{D}(\theta, \phi, f)_{\mathcal{P}} : \mathbf{e}_{\mathcal{P}} \end{aligned}$ 

with a modulate waveform (firstly done with resolved sources to provide the modulation curve for the foreground Adams & Cornish)

 Binary Black Holes and Binary Neutron Stars from LIGO/Virgo Band

- \*  $\Omega_{GW} \simeq 1.8 \times 10^{-9} 2.5 \times 10^{-9}$  at 25 Hz Chen *et al.* (2019)
- $* \ \Omega_{GW} \simeq 4.97 \times 10^{-9} 2.58 \times 10^{-8}$  at 25 Hz Périgois *et al.* (2020)
- \* Cosmological sources (early universe)

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#### Energy density spectrum:

Model of Energy density spectrum SGWB sources

$$\Omega_{GW}(f) = \frac{A_1 \left(\frac{f}{f_*}\right)^{\alpha_1}}{1 + A_2 \left(\frac{f}{f_*}\right)^{\alpha_2}} + \Omega_{Astro} \left(\frac{f}{f_*}\right)^{\alpha_{Astro}} + \Omega_{Cosmo} \left(\frac{f}{f_*}\right)^{\alpha_{Cosmo}}$$

with  $\alpha = 0$  for the cosmological component,  $\alpha = 2/3$  for the astrophysical component and low frequency DWD  $(\Omega_{DWD,LF}(f) = \frac{A_1}{A_2} \left(\frac{f}{f_*}\right)^{\alpha_1 - \alpha_2}).$ 

<u>Goal</u>: Detecting a cosmological SGWB with LISA in the presence of an astrophysical background and Galactic foreground

MCMC: Markov chains Monte Carlo

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#### » MCMC (Markov chain Monte Carlo)

<u>Likelihood function</u>, ( $d = data, \theta = parameter$ )

# hood $\mathcal{L}(\mathbf{d}|\theta) = -\frac{1}{2} \sum_{k=0}^{N} \left[ \frac{d_A^2}{S_A + N_A} + \frac{d_E^2}{S_E + N_E} + \frac{d_T^2}{N_T} + \ln\left(8\pi^3(S_A + NA)(S_E + N_E)N_T\right) \right]$

- \* posterior distribution  $p( heta|d) \propto p( heta) \mathcal{L}(\mathbf{d}| heta)$
- \*~ using log uniform and uniform prior  $\pmb{p}( heta) = \prod_i \pmb{U}( heta_i, \pmb{a}_i, \pmb{b}_i)$
- \* Estimation 10 parameters  $\theta = [N_{acc}, N_{pos}, \Omega_{astro}, \alpha_{astro}, \alpha_{astro}, \alpha_{astro}, A_1, \alpha_1, A_2, \alpha_2].$

 $\Rightarrow$  using a Metropolis-Hasting sampler

Fisher Information Matrix

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#### » Fisher Information Matrix

#### Fisher Information Matrix

$$\begin{split} \mathbf{F}_{ab} &= \frac{1}{2} \mathrm{Tr} \left( \mathcal{C}^{-1} \frac{\partial \mathcal{C}}{\partial \theta_a} \mathcal{C}^{-1} \frac{\partial \mathcal{C}}{\partial \theta_b} \right) \\ &= \frac{1}{2} \sum_{I=A,E,T} \sum_{k=0}^{N} \frac{\frac{\partial S_I(f) + N_I(f)}{\partial \theta_a} \frac{\partial S_I(f) + N_I(f)}{\partial \theta_b}}{\left( S_I(f) + N_I(f) \right)^2} \end{split}$$

Co-variance Matrix

$$\mathcal{C}(\theta, \mathbf{f}) = \begin{pmatrix} \mathbf{S}_{A} + \mathbf{N}_{A} & 0 & 0\\ 0 & \mathbf{S}_{E} + \mathbf{N}_{E} & 0\\ 0 & 0 & \mathbf{N}_{T} \end{pmatrix}$$

with  $N_I$  is the LISA noise of the channel I = [A, E, T] and  $S_I \propto \sum_{\alpha} \Omega_{\alpha} \left(\frac{f}{f_{ref}}\right)^{\alpha}$  the SGWB.  $\Rightarrow \sqrt{F_{aa}^{-1}} = \sigma_a$ 

#### Results 6 parameter A-MCMC

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#### » Results 6 parameter A-MCMC



Uncertainty of the estimation of the Cosmological Amplitude from the Fisher Information study in line (with the Cramer-Rao calculation) and the parametric estimation from the A-MCMC in scatters for the channel A with the noise channel T. The upper horizontal dash line represent the error level 50%. In fact, above the line, the error is greater than 50%.

#### » Results 6 parameter A-MCMC

Prediction of the measurement limit of Cosmological Amplitude in 4 contexts of Isotropic astrophysical background In the LISA noise context (acceleration noise :  $N_{Acc} = 9 \times 10^{-30} \text{ m}^2 \text{s}^{-4} \text{Hz}^{-1}$  and Optical Metrology System noise  $N_{Opt} = 2.25 \times 10^{-22} \text{ m}^2 \text{Hz}^{-1}$ ) of 4 years mission data measurement:

#### Limit for BBH/BNS + Cosmo + LISA noise

\* 
$$\Omega_{astro} = 3.55 \times 10^{-8} \ (25 \text{ Hz})$$
:  $\Omega_{Cosmo,lim} = 7.8 \times 10^{-12} \text{ J}$ 

\*  $\Omega_{astro} = 3.55 \times 10^{-9} \ (25 \text{ Hz}): \Omega_{Cosmo,lim} = 7.8 \times 10^{-1}$ 

\*  $\Omega_{astro} = 1.8 \times 10^{-9} \ (25 \text{ Hz})$ :  $\Omega_{Cosmo,lim} = 3.6 \times 10^{-13}$ 

\*  $\Omega_{astro} = 3.55 \times 10^{-10} \ (25 \text{ Hz})$ :  $\Omega_{Cosmo, lim} = 7.6 \times 10^{-10} \ (25 \text{ Hz})$ 

 $\Rightarrow$  paper (PhysRevD.103.103529).

#### Orbital Modulation of the White dwarf binaries in our Galaxy

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#### » Orbital Modulation of the White dwarf binaries in our Galaxy



Total Gravitational signal of the white-Dwarf binaries seen by LISA

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#### » Orbital Modulation of the White dwarf binaries in our Galaxy



Measurement of the orbital Modulation of the DWD amplitude. In grey:  $\Omega_{Mod,i} = \frac{4\pi^2}{3H_0} \left(\frac{c}{2\pi L}\right)^2 A_i^2$ . In red scatter : 50 A-MCMC of 8 parameters (BBH + WD + LISA noise) for small sections of the year. In green, fit on the 50 runs to estimate the modulation. Modulation model :  $\Omega_{Mod,i} = \Omega_{DWD,LF}^{4} \left(F_{+,i}^2 + F_{\times,i}^2\right)$ .

#### » A-MCMC of 8 parameters (BBH + WD + LISA noise)



Input of the MCMC:

\*  $A_3 = \overline{4.4 \times 10^{-12}} (f_* = \frac{2\pi L}{c} \simeq 0.019 \text{ Hz}), \alpha_3 = 2/3$ 

\* data model:  

$$S(f) = \frac{A_1 \left(\frac{f}{f_*}\right)^{\alpha_1}}{1 + A_2 \left(\frac{f}{f_*}\right)^{\alpha_2}} + A_3 \left(\frac{f}{f_*}\right)^{\alpha_3}$$

For 
$$1 \ll {\sf A}_2 \left(rac{f}{f_*}
ight)^{lpha_2}$$
 (low frequency):

Energy spectral density of White dwarf binaries at low frequency

$$\Omega_{\textit{WD}}(\textit{f}) \simeq \frac{\textit{A}_1}{\textit{A}_2} \left(\frac{\textit{f}}{\textit{f}_*}\right)^{\alpha_1 - \alpha_2}$$

At low frequency, it can be approximated by a power law function, for a white dwarf binaries foreground the slope  $\alpha = \alpha_1 - \alpha_2 = \frac{2}{3}$ .

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#### » A-MCMC of 8 parameters (BBH + WD + LISA noise)



#### uput of the A-MCMC \* BBH/BNS: \* $\Omega = 4.46 \times 10^{-12} \pm 1.2 \times 10^{-13}$ \* $\alpha = 0.65 \pm 0.04$ \* WD low frequencies: \* $\Omega = 1.94 \times 10^{-8} \pm 1.33 \times 10^{-8}$ \* $\alpha = 0.68 \pm 0.06$

#### 10 parameters runs of A-MCMC (LISA noise + BBH/BNS + DWD + Cosmo)

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## » 10 parameters runs of A-MCMC (LISA noise + BBH/BNS + DWD + Cosmo)



Uncertainty Estimation of the Cosmological Amplitude from the Fisher Information study in line (for 4 times duration) and the parametric estimation from the A-MCMC in scatters for the channel A with the noise channel T. The upper horizontal dash line represent the error level 50%. In fact, above the line, the error is greater than 50%. Context. Stochastic background in USA paper of BBH/BNS prediction MCMC Markov chains Monte Carlo So Results 6 parameter A-MCMC Orbital Modu oo Norono Norono Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Norono Natrix Results 6 parameter A-MCMC Orbital Modu oo Natrix Results 6 parameter A-MCMC Orbital Modu o

#### Times effect

We see no significant influence of the time duration (4,6 and 10 years) on the Cosmological measurement

Measurement limit

$$\Omega_{\textit{Cosmo,lim}} = 8 \times 10^{-13}$$

#### Limitation

BBH and BNS principal limitation for the Cosmological background

 $\Rightarrow$  paper in preprint (arXiv:2105.04283)

#### Correlation in LISA PathFinder (LPF) and LISA noise

#### » LPF Correlation Noise in LISA



Correlation between differential Test-mass acceleration LPF L0 chains without glitch (de-glitch method on the spectral domain) and Magnetic Field, Temperature and  $\mu$ -Thruster

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#### » Spectral Separability : Uncertainty without LPF Correlation



Cosmological Amplitude Uncertainty Estimation, Fisher Information study in line and A-MCMC in scatters. The upper horizontal dash line represent the error level 50% (limitation criterion ).

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#### » Spectral Separability :Uncertainty with LPF Correlation



Cosmological Amplitude Uncertainty Estimation, Fisher Information study in line and A-MCMC in scatters. The upper horizontal dash line represent the error level 50% (limitation criterion ).

#### Conclusion

#### » Conclusion

- We provide evidence that it is possible to measure for LISA the cosmological SGWB :

Measurement limit

 $\Omega_{\rm Cosmo.lim} = 8 \times 10^{-14} - 8 \times 10^{-12}$ 

#### Limitation

BBH and BNS principal limitation for the Cosmological background

- We use Lamberts *et. al.*, possibility to generate white dwarf waveform with other catalogues

- Interest to use estimating more complex backgrounds, like broken power laws, or spectrum with peaks. Our method can be easily expanded with more complex cosmological backgrounds



#### » Conclusion

- We provide evidence that it is possible to measure the cosmological SGWB with and without LPF correlation:

Measurement limit

 $\Omega_{\it Cosmo,}$  lim without LPF  $= 6.0~ imes 10^{-13}$   $\Omega_{\it Cosmo,}$  lim with LPF  $= 4.7~ imes 10^{-13}$ 

We measure the effect of the phase error due to LO light back-scattered in the channel A, E and T. High frequency effect, not a problem for stochastic, but potentially other searches.
High flexibility of our code for other types of noise and correlated noise.

### The End : Thank You !