# The SciPol project

characterizing and mitigating the instrumental, astrophysical and environmental systematics effects



Josquin Errard, APC / CNRS, Friday Nov 8, 2024 — Milan Bicocca





























#### environmental + Galactic foregrounds

- instrumental requirements are usually derived from component separation (instr. syst. biases for LiteBIRD look like dust e.g. 2202.02773 see also talks by Marco, Davide, Nadia, ...)
- Ward et al. 2018 (1803.07630) in the context of SO



we cannot treat these separately. Effective systematic residuals are complex :( we can/have to consider the two effects together and calibrate out our instruments + foregrounds SEDs :)

![](_page_15_Picture_0.jpeg)

Science from the large scale cosmic microwave background polarization structure

we cannot treat these separately. Effective systematic residuals are complex :( we can/have to consider the two effects together and calibrate out our instruments + foregrounds SEDs :)

![](_page_16_Figure_0.jpeg)

adapted from

Kogut et al. 2016

![](_page_17_Figure_0.jpeg)

![](_page_18_Figure_0.jpeg)

![](_page_19_Figure_0.jpeg)

![](_page_20_Figure_0.jpeg)

![](_page_21_Figure_0.jpeg)

$$-2\log(\mathcal{L})(\mathbf{A},s) = (d - \mathbf{A}s)^T \mathbf{N}^{-1} (d - \mathbf{A}s)$$

![](_page_22_Figure_0.jpeg)

![](_page_23_Figure_0.jpeg)

![](_page_24_Figure_0.jpeg)

Vergès, JE, Stompor (2020)

![](_page_25_Figure_0.jpeg)

Vergès, JE, Stompor (2020) + see talk by Ema yesterday

![](_page_25_Figure_2.jpeg)

![](_page_26_Figure_0.jpeg)

![](_page_26_Figure_1.jpeg)

Vergès, JE, Stompor (2020) + see talk by Ema yesterday

$$\begin{pmatrix}
\mathcal{I}(\gamma_{t},\nu) \\
\mathcal{C}_{0}(\gamma_{t},\nu) \\
\mathcal{S}_{0}(\gamma_{t},\nu) \\
\mathcal{C}_{4}(\gamma_{t},\nu) \\
\mathcal{S}_{4}(\gamma_{t},\nu)
\end{pmatrix} \equiv \sum_{\substack{\text{comp=cmb} \\ \text{dust,sync}}} \underbrace{\mathbf{M}(\nu) \mathbf{A}^{\text{comp}}(\nu,\nu_{0})}_{\equiv \mathbf{\Lambda}^{\text{comp}}(\nu,\nu_{0})} \underbrace{\begin{pmatrix}
I_{\text{comp}}(\gamma_{t},\nu_{0}) \\
Q_{\text{comp}}(\gamma_{t},\nu_{0}) \\
U_{\text{comp}}(\gamma_{t},\nu_{0})
\end{pmatrix}}_{\equiv s_{\text{comp}}(\gamma_{t},\nu_{0})}$$

![](_page_27_Figure_0.jpeg)

![](_page_27_Figure_1.jpeg)

$$\begin{pmatrix} \mathcal{I}(\gamma_{t},\nu) \\ \mathcal{C}_{0}(\gamma_{t},\nu) \\ \mathcal{S}_{0}(\gamma_{t},\nu) \\ \mathcal{C}_{4}(\gamma_{t},\nu) \\ \mathcal{S}_{4}(\gamma_{t},\nu) \\ \equiv d(\gamma_{t},\nu) \end{pmatrix} \equiv \sum_{\substack{\text{comp=cmb} \\ \text{dust,sync}}} \underbrace{\mathbf{M}(\nu) \mathbf{A}^{\text{comp}}(\nu,\nu_{0})}_{\equiv \mathbf{\Lambda}^{\text{comp}}(\nu,\nu_{0})} \underbrace{\begin{pmatrix} \mathrm{I}_{\text{comp}}(\gamma_{t},\nu_{0}) \\ \mathrm{Q}_{\text{comp}}(\gamma_{t},\nu_{0}) \\ \mathrm{U}_{\text{comp}}(\gamma_{t},\nu_{0}) \end{pmatrix}}_{\equiv s_{\text{comp}}(\gamma_{t},\nu_{0})}$$

"[...] We find that some of the instrumental parameters, in particularly those describing the HWP can be successfully constrained by the data themselves without need for external information, while others, like bandpasses, need to be known with good precision in advance." 

 Image: series of the series

![](_page_27_Figure_5.jpeg)

Jost, JE, Stompor (2023) → see talk by Baptiste this morning + LiteBIRD article on cosmic birefringence (in prep, 2024)

- -

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d1s1 priors on all channels d7s3 priors on all channels

![](_page_28_Figure_1.jpeg)

prior

$$d_{p} = \underbrace{M_{p}(\{\alpha_{1}, ..., \alpha_{n_{f}}\}) A_{p}(\{\beta_{fg}\})}_{\Lambda_{p}(\{\Gamma\})} \underbrace{\mathcal{B}(\beta_{b}) c_{p}}_{S_{p}} + n_{p}}_{\mathbf{A}_{p}(\{\Gamma\})}$$

$$\underbrace{\mathsf{Spectral likelihood}}_{Spectral likelihood} \\ \langle S \rangle = -2 \sum_{p} \operatorname{tr} (N_{p}^{-1} \Lambda_{p} (\Lambda_{p}^{t} N_{p}^{-1} \Lambda_{p})^{-1} \Lambda_{p}^{t} N_{p}^{-1} \langle d_{p} d_{p}^{t} \rangle}_{+\sum_{\alpha_{i}} \underbrace{(\alpha_{i} - \hat{\alpha}_{i})^{2}}_{2\sigma_{\alpha_{i}}^{2}}}$$

# $\begin{pmatrix} I \\ Q \\ U \end{pmatrix} = d = \mathbf{M}_{inst}(\gamma) \mathbf{A}(\beta) s + n(\sigma)$

![](_page_30_Figure_0.jpeg)

![](_page_31_Figure_0.jpeg)

![](_page_32_Figure_0.jpeg)

![](_page_33_Picture_0.jpeg)

Science from the large scale cosmic microwave background polarization structure

→ CMB data analysis toolbox for a generalized (time-domain) component separation

$$d = \mathbf{M}_{\text{inst}}(\gamma) \mathbf{A}(\beta) s + n(\sigma)$$

![](_page_33_Figure_4.jpeg)

![](_page_34_Picture_0.jpeg)

Science from the large scale cosmic microwave background polarization structure

→ CMB data analysis toolbox for a generalized (time-domain) component separation

$$d = \mathbf{M}_{\text{inst}}(\gamma)\mathbf{A}(\beta)s + n(\sigma)$$

![](_page_34_Figure_4.jpeg)

## → huge numerical challenge!

#### Global scientific goal: derive robust estimates of the CMB maps and their cosmological inference

This involves

- modeling of the instrumental response (WP1-1), foregrounds (WP1-2), noise properties (WP1-3)
- generalization of the map-making and component separation operations (WP2-1 and WP2-2), their optimisation and exploitation (WP2-3)
- perform cosmological inference (WP3-1), delensing (WP3-2), and the creation and application of robustness tests (WP3-3)

![](_page_35_Figure_5.jpeg)

![](_page_36_Figure_0.jpeg)

![](_page_37_Picture_0.jpeg)

![](_page_37_Picture_1.jpeg)

Wuhyun Sohn

Pierre Chanial

![](_page_37_Picture_4.jpeg)

Simon Biquard Wassim Kabalan

### SciPol Toolbox

- Modularity, extensibility, simplicity
- Able to handle SO- and S4-like data sets volumes
- Compatibility with TOAST
- Non-ideal optical components (talks by Ema and Matteo yesterday)
- JAX: Just In Time (JIT) compilation, run the same code anywhere on CPUs and GPUs, laptops and super-computers (e.g., NERSC, national infrastructures)
- 1st steps: "max-L" and "template" map-making (following **MAPPRAISER**'s formalism)
- Multi-GPU parallelization (soon)
- Framework for robust B-mode analysis

![](_page_37_Picture_16.jpeg)

Framework for Unified and Robust data Analysis with JAX

automatic differentiation (autodiff)

Just-In-Time (JIT) compilation

GPU-accelerated computing

support for vectorized computation

![](_page_37_Picture_22.jpeg)

![](_page_37_Picture_23.jpeg)

Beginners tutorial available

here: <u>https://scipol.in2p3.fr/scipol-</u> science-from-the-large-scale-cosmic-

microwave-background-polarization-

structure/workshops-and-events/

maps of the amplitudes of the sky operator modeling the data collection for components (pixel *p*, component *c*) instrument response detector *i*, time sample *t* (pointing, beam, band normalized at a reference frequency and for frequency band  $\nu$ passes, imperfections, etc.) that is shared with the mixing matrix.  $\int_{BP(\nu')} d\nu' \mathbf{M}_{(i,t,\nu',p)}^{(\gamma)} \mathbf{A}_{(t,\nu',c,p)}^{(\beta)} s_{(p,c)} + n_{(i,t,\nu)}$ operator modeling the frequency boundaries of the noise term, likely scaling of the sky components c Gaussian with a band pass centered (CMB, astrophysical foregrounds, covariance N on frequency  $\nu$ . atmosphere, ground, etc.)

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#### example in FURAX

**h** = bandpass @ pol @ rot @ hwp @ sampling @ mixing matrix

tod = **h**(sky signal)

solution = ((**h**.T @ invN @ **h**).I @ **h**.T @ invN)(tod)

![](_page_40_Figure_0.jpeg)

![](_page_41_Figure_0.jpeg)

![](_page_42_Figure_0.jpeg)

Simon Biquard

![](_page_43_Picture_0.jpeg)

On-going development of parametric component separation within the FURAX framework

Wassim Kabalan

- Does everything fgbuster does but "better"
  - Uses the FURAX operators to represent linear algebra to efficient computing
  - Is written in JAX, hardware accelerated and have easy access to gradients
- Beyond fgbuster
  - Uses a full bayesian approach to find optimal patches for component separation

![](_page_43_Figure_8.jpeg)

![](_page_43_Figure_9.jpeg)

![](_page_44_Figure_0.jpeg)

![](_page_44_Figure_1.jpeg)

- preliminary tests for an atmospheric time-domain component separation are promising (non-linear parameters are the wind and the PWV)
- by combining this component separation with instrumental modeling, our target is to use atmosphere to characterize the instrumental response (I-to-P leakage for instance)

![](_page_44_Figure_4.jpeg)

FIG. 1.— Atmospheric transmission from the Atacama plateau at the zenith for different amounts of precipitable water vapor. This is obtained using the ATM code, Pardo et al. (2001).

![](_page_45_Picture_0.jpeg)

![](_page_45_Picture_1.jpeg)

Benjamin Beringue

Baptiste Jost Magdy Morshed

![](_page_45_Picture_4.jpeg)

Map-basEd Generalized Analysis for Testing cOsmological Physic (test-bed for SciPol time-domain analysis)

from Wolz et al. "pipeline comparison and validation for large-scale B-modes", 2302.04276

![](_page_45_Picture_7.jpeg)

![](_page_45_Figure_8.jpeg)

![](_page_46_Picture_0.jpeg)

#### scipol.in2p3.fr

#### github.com/CMBSciPol

#### under intense development stay tune & visit us in Paris!

![](_page_46_Figure_4.jpeg)

| Morshed et al. (2024)   |
|---|
| MICMAC       Public         Pixel implementation for the non-parametric component separation         data-analysis       component-separation         cmb       gibbs-sampling       jax         Image: Jupyter Notebook       . ▲ GNU General Public License v3.0       . ※ 2       . ① 1       . ① 0       . Updated 2 days ago   |
| Megatop       Private         A map-based CMB polarization experiment data analysis pipeline from component separation to r estimation         ● Jupyter Notebook ・ ♀ 0 ・ ☆ 2 ・ ⊙ 0 ・ ☆ 0 ・ ☆ 0 ・ ☆ 0 ・ ☆ 0 ・ ☆ 0 ・ ☆ 0 ⋅ ↔ 0 ⋅ ↔ |
| MICMAC_playground       Private         ● Jupyter Notebook       ・ ☆ 0 ・ 0 ・  |
| cmb_map_visualisation       Private         Visualisation of 3D CMB maps using blender         Jupyter Notebook       ・ ☆ 0 ・ ☆ 0 ・ ŷ 0 ・ ŷ 0 ・ ∪ pdated on Jun 13  |
| jax-healpyPublicHealpy with JAXPython $\cdot$ $\frac{1}{2}$ 3 $\cdot$ $\frac{1}{2}$ 2 $\cdot$ $\bigcirc$ 0 $\cdot$ $\frac{1}{2}$ 0 $\cdot$ Updated on Jun 12  |
| SMICAX       Private         SMICA, accelerated with JAX         Jupyter Notebook $rac{1}{2}$ 0 · $r$               |
| <b>benchmark-fft</b> Private<br>• C++ $\cdot$ $\circ$ $\cdot$ $\circ$   |
| astrosim       Private         JAX building blocks for astrophysical reconstructions         Python $\frac{1}{2}$ 0 $\frac$   |

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