

Cosmoglobe

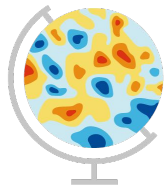
Cosmoglobe

– mapping the sky from the Milky Way to the Big Bang

Hans Kristian Eriksen and Ingunn Kathrine Wehus
University of Oslo

MPA Garching, 21 September 2023

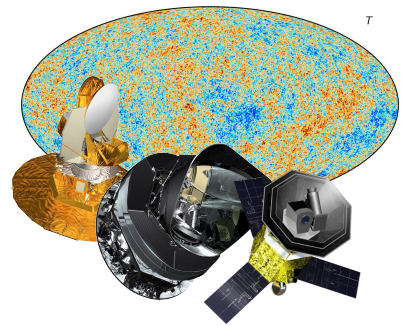




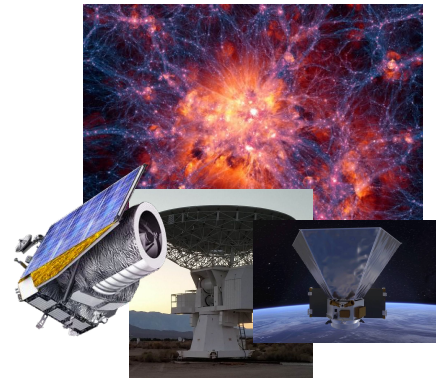
Cosmoglobe

-mapping the universe from the Solar system to the Big Bang

Early universe



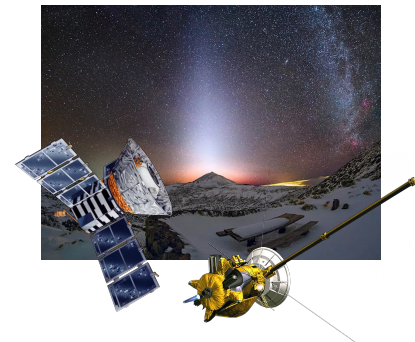
Large-scale structure

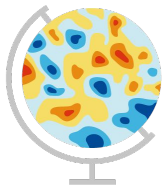


Milky Way

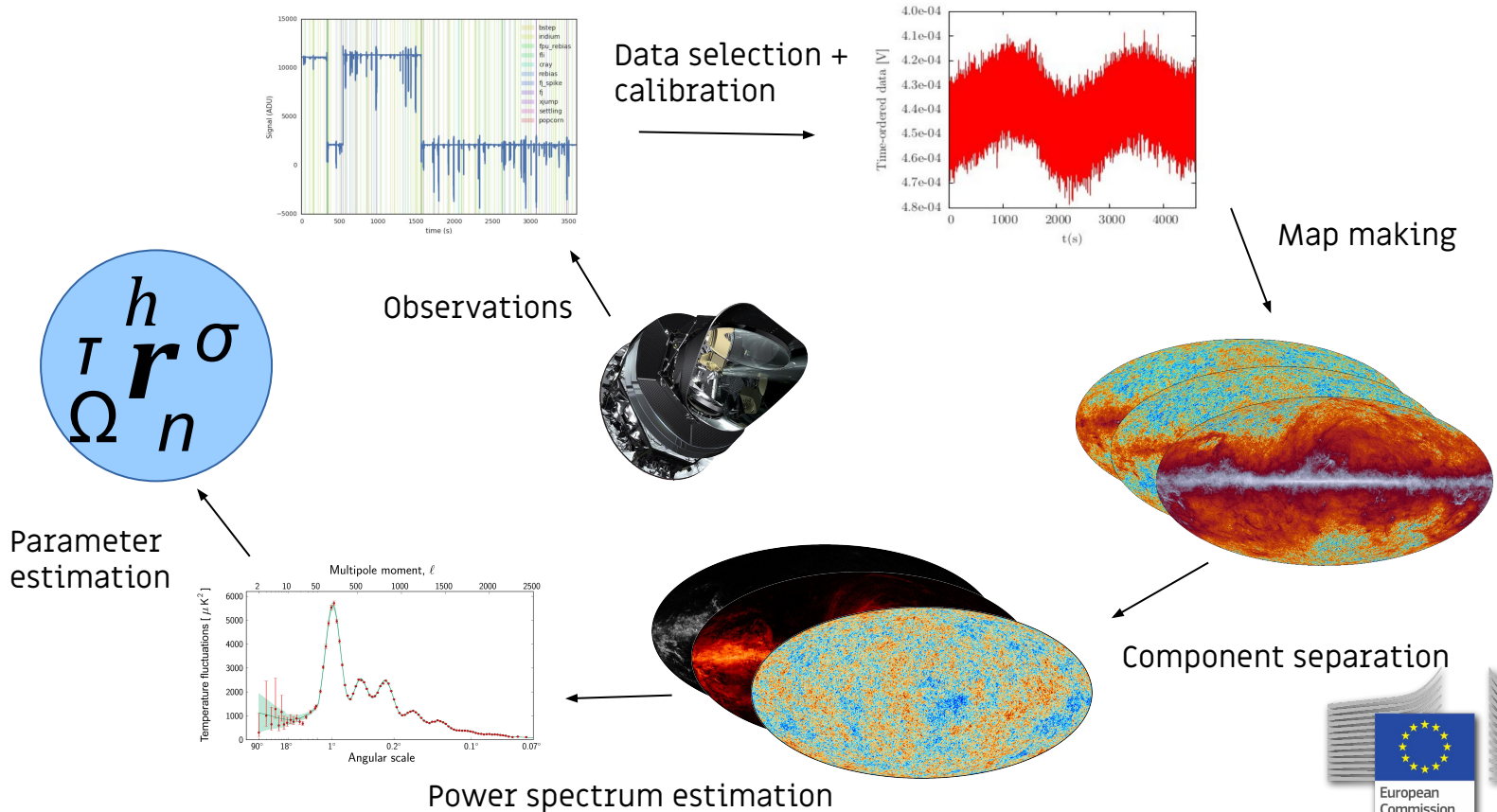


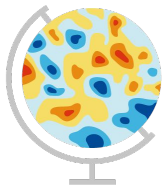
Solar system



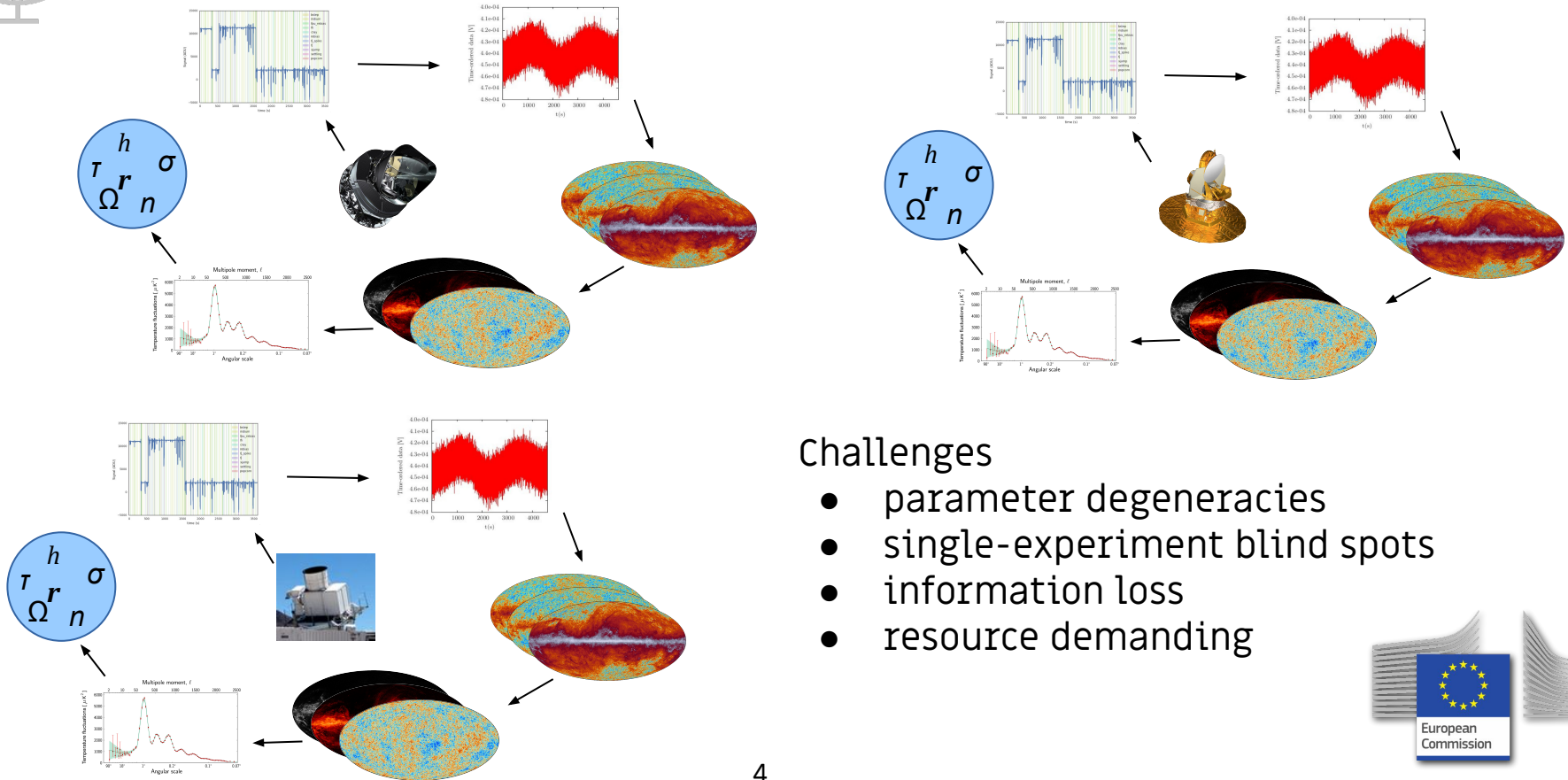


Classic linear CMB analysis pipeline





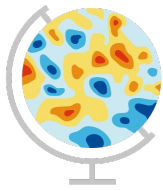
Classic linear CMB analysis pipelines



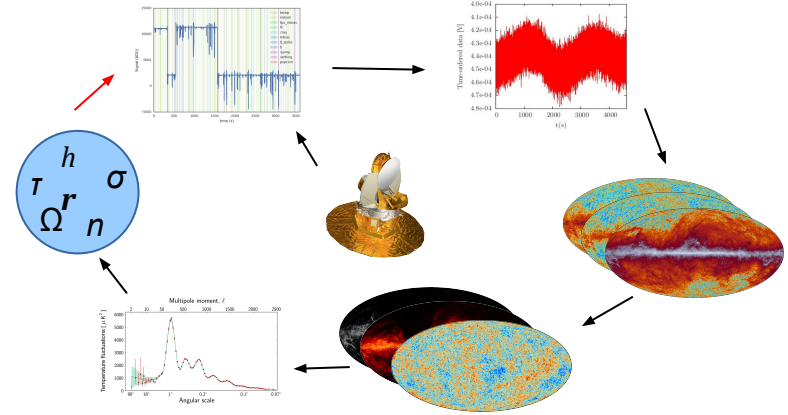
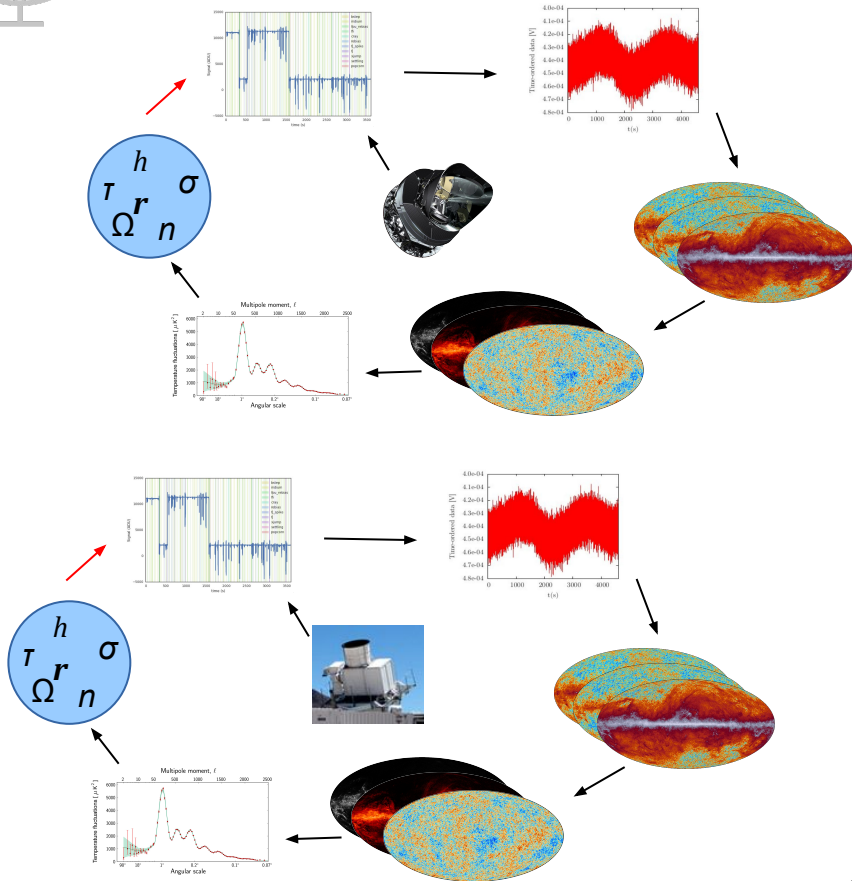
Challenges

- parameter degeneracies
- single-experiment blind spots
- information loss
- resource demanding





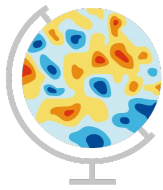
Classic linear CMB analysis pipelines



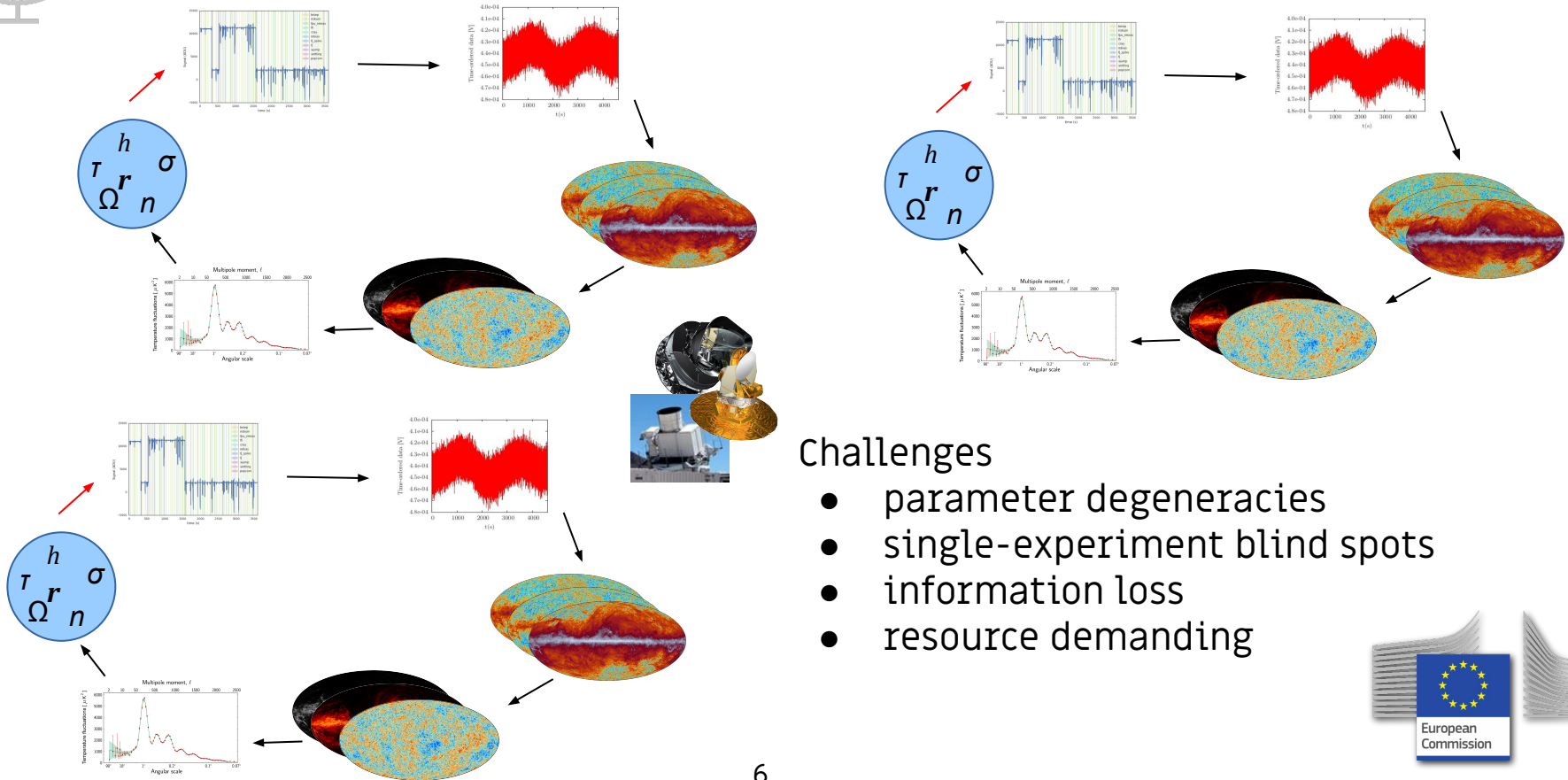
Challenges

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Classic linear CMB analysis pipelines

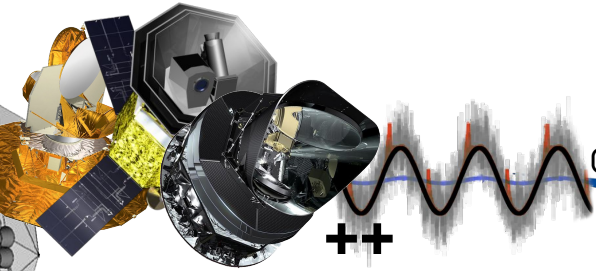
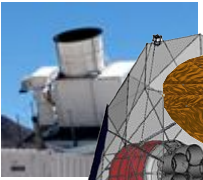
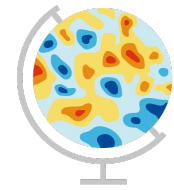


Challenges

- parameter degeneracies
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- resource demanding

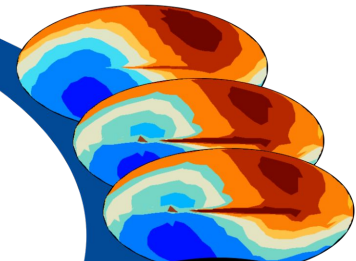


Global end-to-end analysis pipeline



Calibration

Map-making

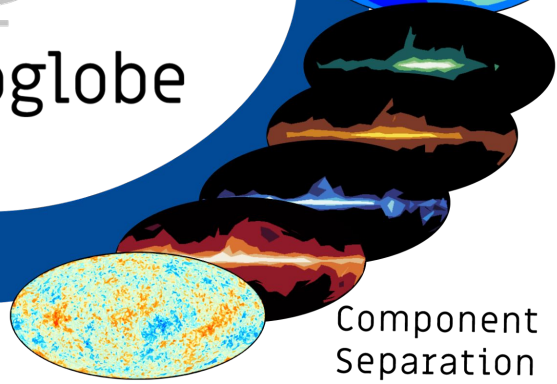


Ω_Λ Ω_r Ω_ν
 Ω_m r Ω_b
 n σ_8 τ
Parameter
Estimation

Cosmoglobe

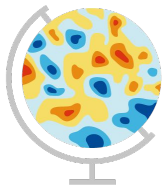


Power spectra



Component
Separation



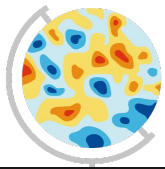


Cosmoglobe

-mapping the universe from the Solar system to the Big Bang

- Main idea: **To integrate the world's best data from radio to sub-mm wavelengths into a single model** through **global analysis**
- **Global analysis**: Joint end-to-end pipeline
 - joint estimation of instrumental, astrophysical and cosmological parameters
 - implemented in the Commander code, developed by Planck and BeyondPlanck
- **Global analysis**: Joint multi-experiment analysis
 - complementary experiments break each other's degeneracies
 - data can be integrated both in the form of (preferably) time-ordered data and (secondarily) sky maps
- **Global analysis**: Joint effort from global community
 - open Science philosophy with strong focus on collaboration
 - the Cosmoglobe idea/project/community is input driven and evolving
 - driven by young scientists





Cosmoglobe global community

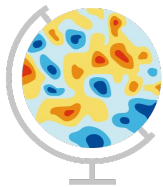
cosmoglobe.uio.no



Yearly intensive course and workshops

Please join us :-)





Cosmoglobe algorithm in one slide

1. Write down an explicit parametric model for the observed data:

$$d_{j,t} = g_{j,t} \mathbf{P}_{tp,j} \left[\mathbf{B}_{pp',j}^{\text{symm}} \sum_c \mathbf{M}_{cj}(\beta_{p'}, \Delta_{\text{bp}}^j) a_{p'}^c + \mathbf{B}_{j,t}^{\text{asymm}} (\mathbf{s}_j^{\text{orb}} + \mathbf{s}_t^{\text{fsl}}) \right] + n_{j,t}^{\text{corr}} + n_{j,t}^{\text{w}}$$

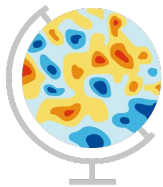
Let $\omega = \{\text{all free parameters}\}$

2. Derive the joint posterior distribution with Bayes' theorem:

$$P(\omega | \mathbf{d}) = \frac{P(\mathbf{d} | \omega) P(\omega)}{P(\mathbf{d})} \propto \mathcal{L}(\omega) P(\omega).$$

3. Map out $P(\omega | \mathbf{d})$ with standard Markov Chain Monte Carlo (MCMC) methods, in particular Gibbs sampling





Gibbs sampling

- The posterior contains millions of correlated and non-Gaussian parameters. How is it possible to map out this distribution?
- Answer: Gibbs sampling
 - Rather than sampling from or maximizing the full joint distribution, iterate over conditionals
- We apply this to our problem in terms of the following Gibbs chain:

$$\mathbf{a}_i \leftarrow P(\mathbf{a}_i | \beta_i, g_v, \mathbf{m}_v, \Delta_v, C_\ell)$$

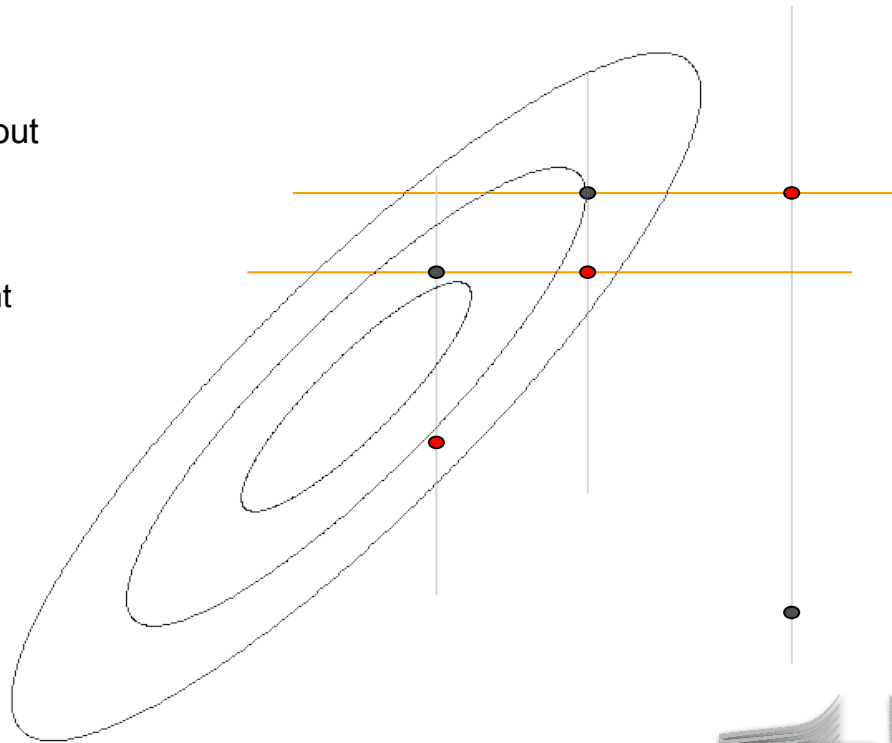
$$\beta_i \leftarrow P(\beta_i | \mathbf{a}_i, g_v, \mathbf{m}_v, \Delta_v, C_\ell)$$

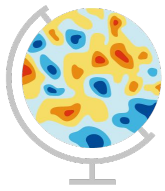
$$g_v \leftarrow P(g_v | \mathbf{a}_i, \beta_i, \mathbf{m}_v, \Delta_v, C_\ell)$$

$$\mathbf{m}_v \leftarrow P(\mathbf{m}_v | \mathbf{a}_i, \beta_i, g_v, \Delta_v, C_\ell)$$

$$\Delta_v \leftarrow P(\Delta_v | \mathbf{a}_i, \beta_i, g_v, \mathbf{m}_v, C_\ell)$$

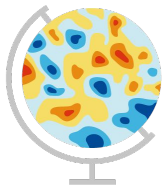
$$C_\ell \leftarrow P(C_\ell | \mathbf{a}_i, \beta_i, g_v, \mathbf{m}_v, \Delta_v)$$





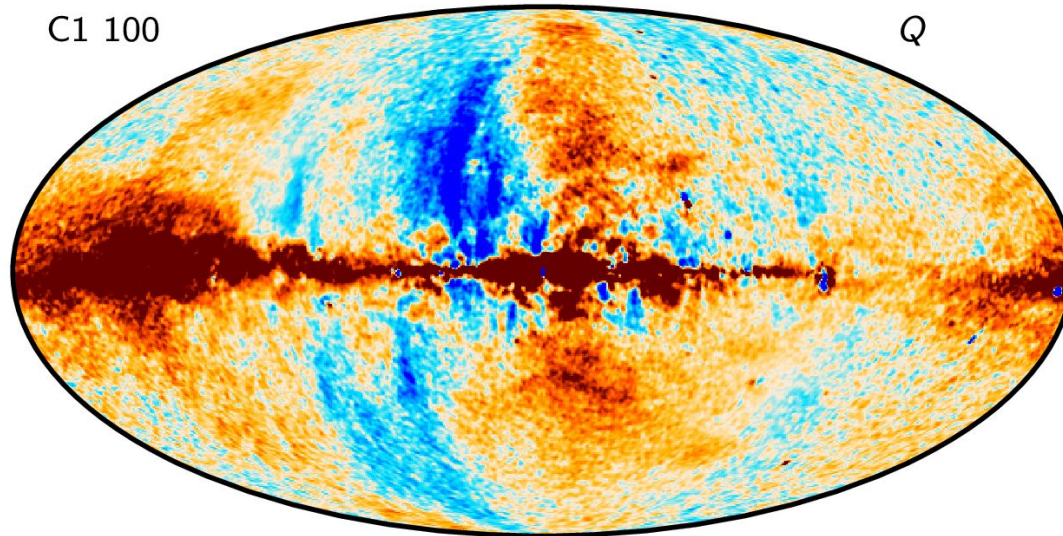
Global analysis proof of concept: BeyondPlanck - reanalysis of Planck LFI data

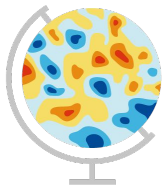
- Included data
 - **Planck LFI 30, 44 and 70 GHz time-ordered data**
 - **Planck 857 GHz** to constrain thermal dust intensity
 - **Planck 353 GHz** polarization-only to constrain thermal dust polarization
 - **WMAP 33-61 GHz** in T+P to constrain low-frequency foregrounds
 - **Haslam 408 MHz** to constrain synchrotron intensity
- Intermediate *Planck HFI* and *WMAP 23 GHz* data were **not** included, because they have higher signal-to-noise ratios than Planck LFI



Global analysis proof of concept: BeyondPlanck - reanalysis of Planck LFI data

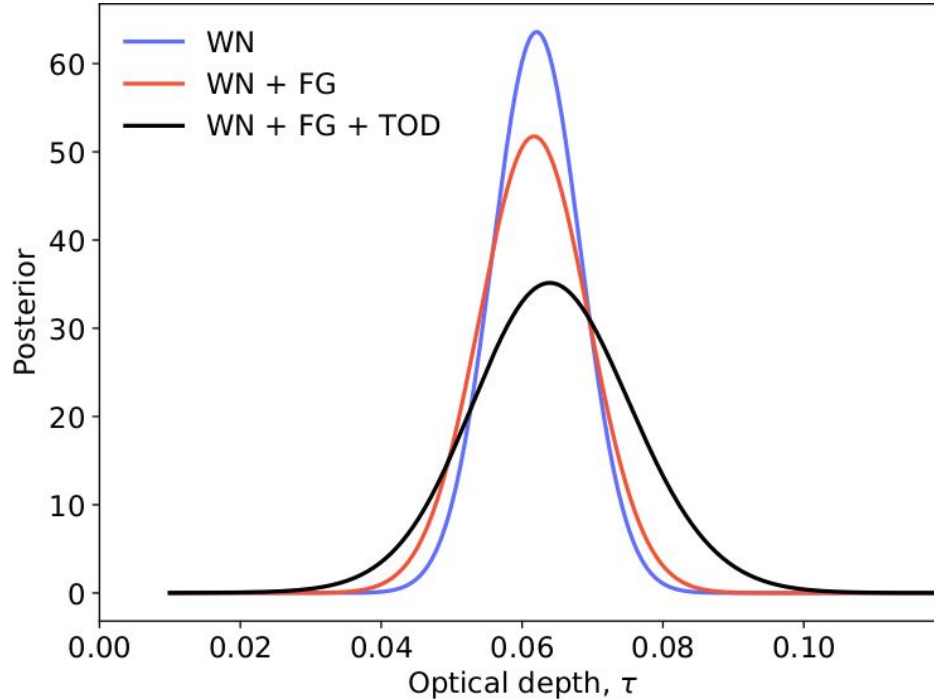
Joint analysis of Planck LFI (tod) + 353/857 + WMAP Ka-V + Haslam (maps)





Global analysis impact on cosmological parameters

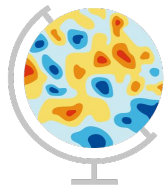
BeyondPlanck



End-to-end global analysis generally yields:

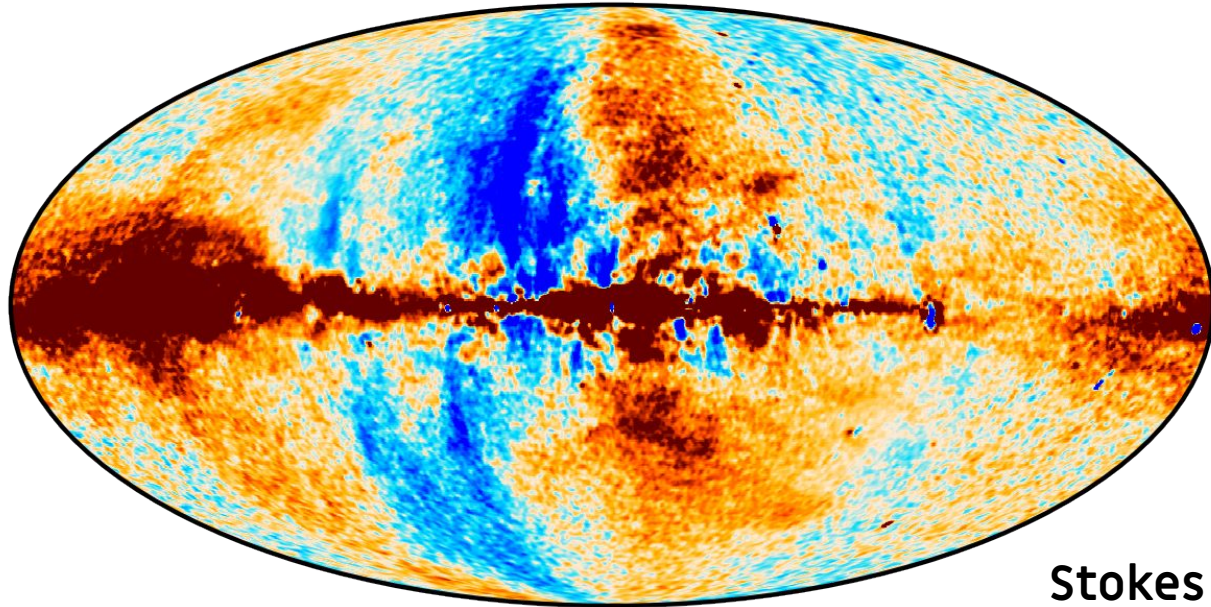
- larger *and more accurate* uncertainties
- lower systematic uncertainties



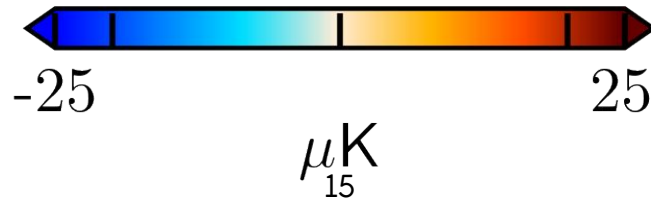


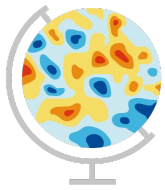
BeyondPlanck - map results

30 GHz BeyondPlanck map



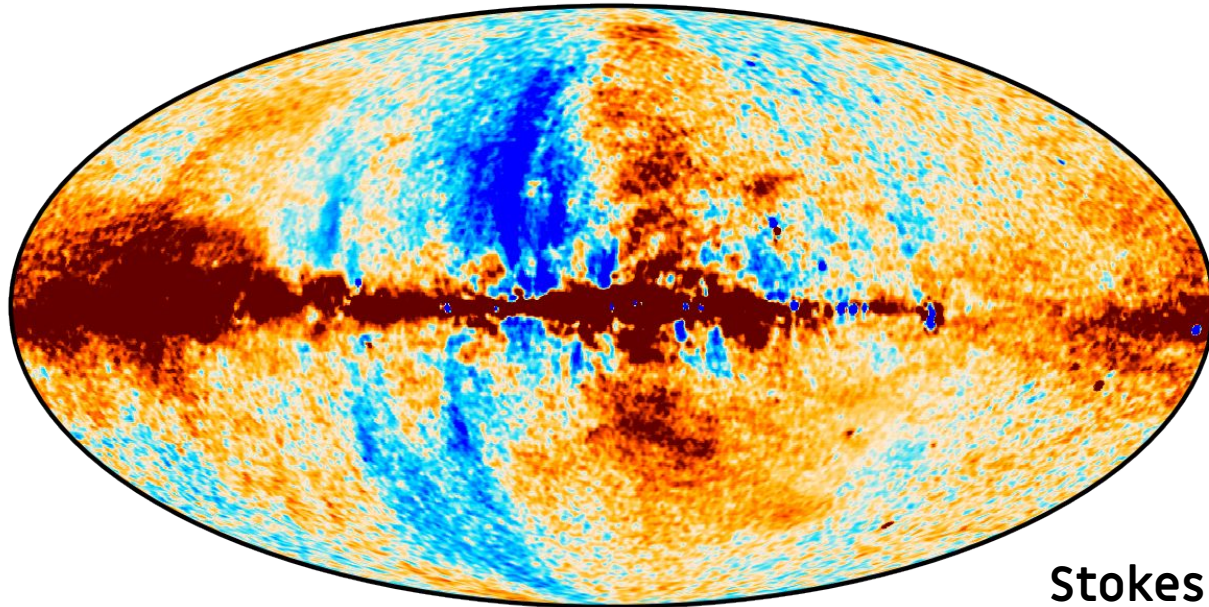
Stokes Q



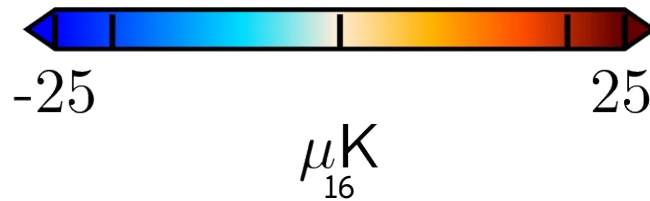


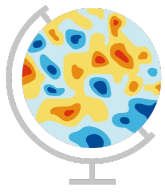
BeyondPlanck - map results

30 GHz Planck legacy map



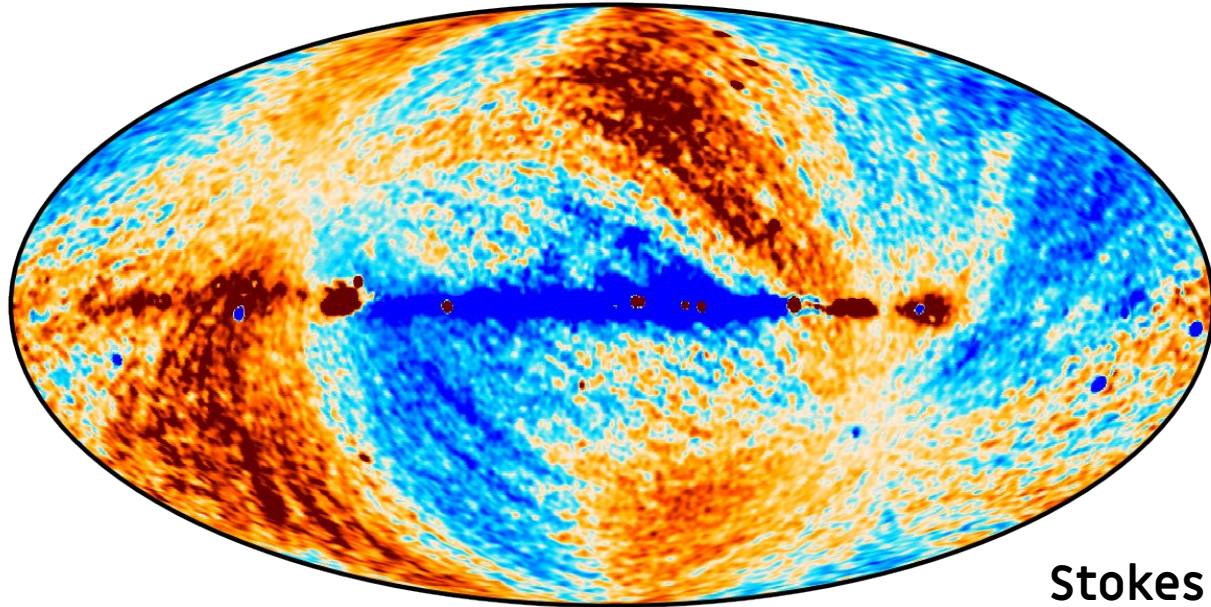
Stokes Q



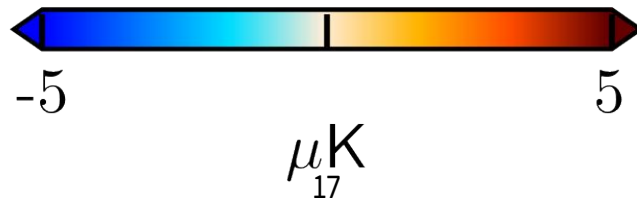


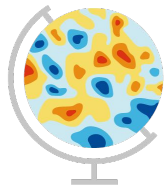
BeyondPlanck - map results

Planck 30 GHz difference map (BeyondPlanck - Planck legacy)



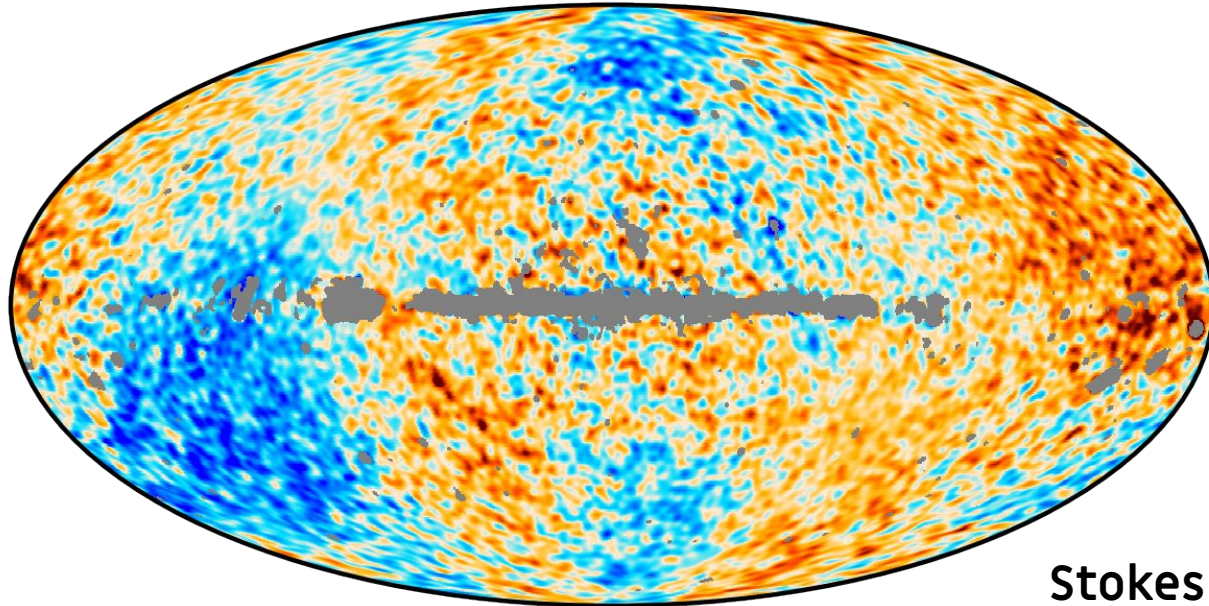
Stokes Q



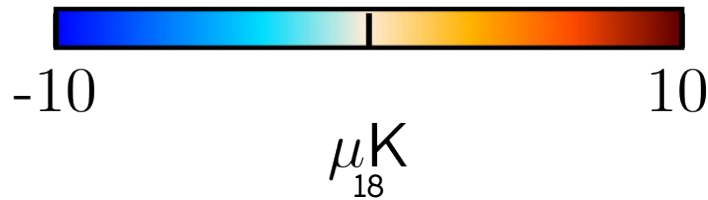


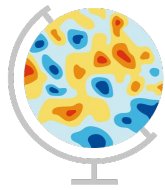
0.495 * WMAP 23 GHz - 30 GHz Planck consistency

WMAP 9-year - Planck legacy



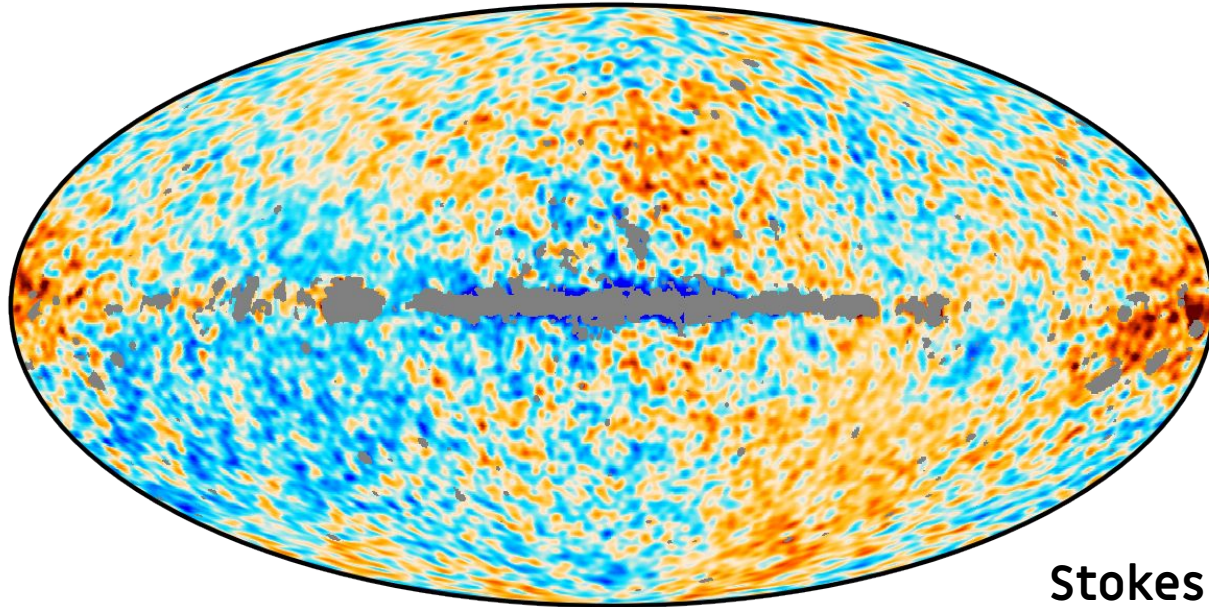
Stokes Q



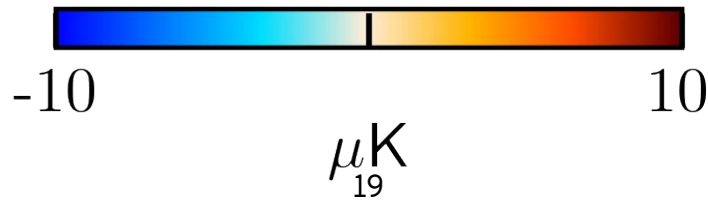


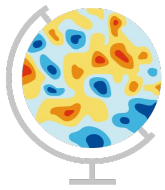
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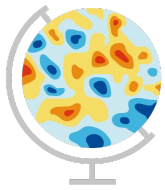
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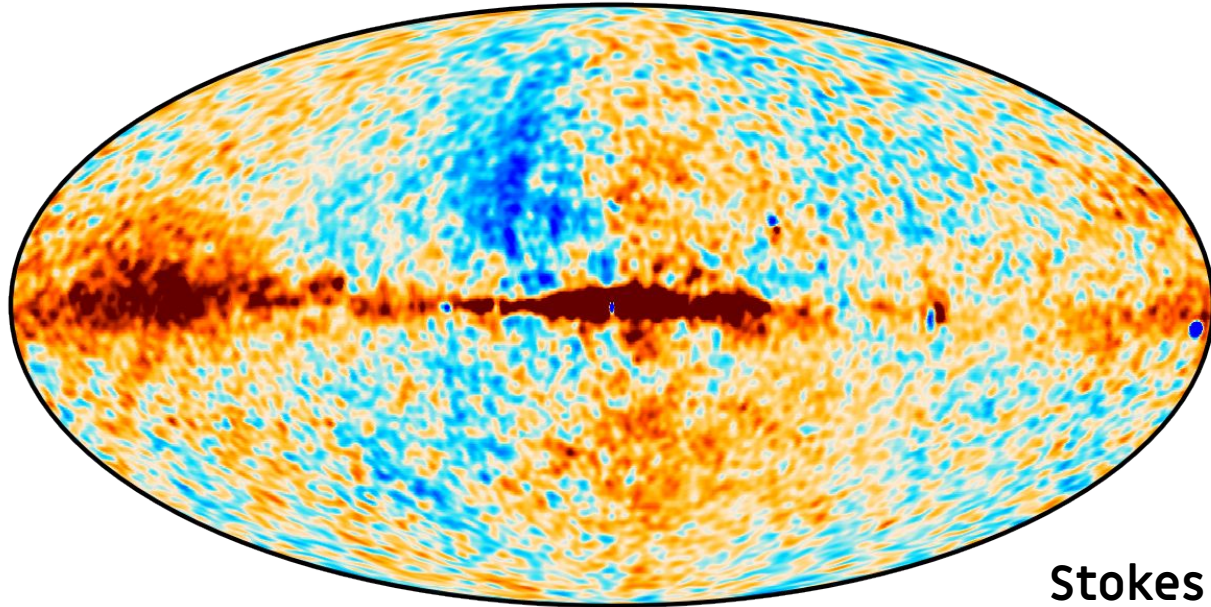
Cosmoglobe DR1: WMAP reanalysis

- Included data
 - **WMAP 23-94 GHz time-ordered data**
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 - **Haslam 408 MHz** to constrain synchrotron intensity
- Intermediate *Planck HFI* still not included

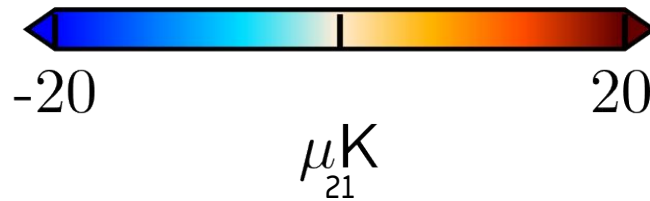


Cosmoglobe DR1: WMAP reanalysis

Q-band (41 GHz) 9-year WMAP

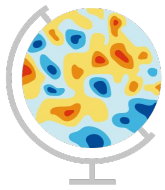


Stokes Q



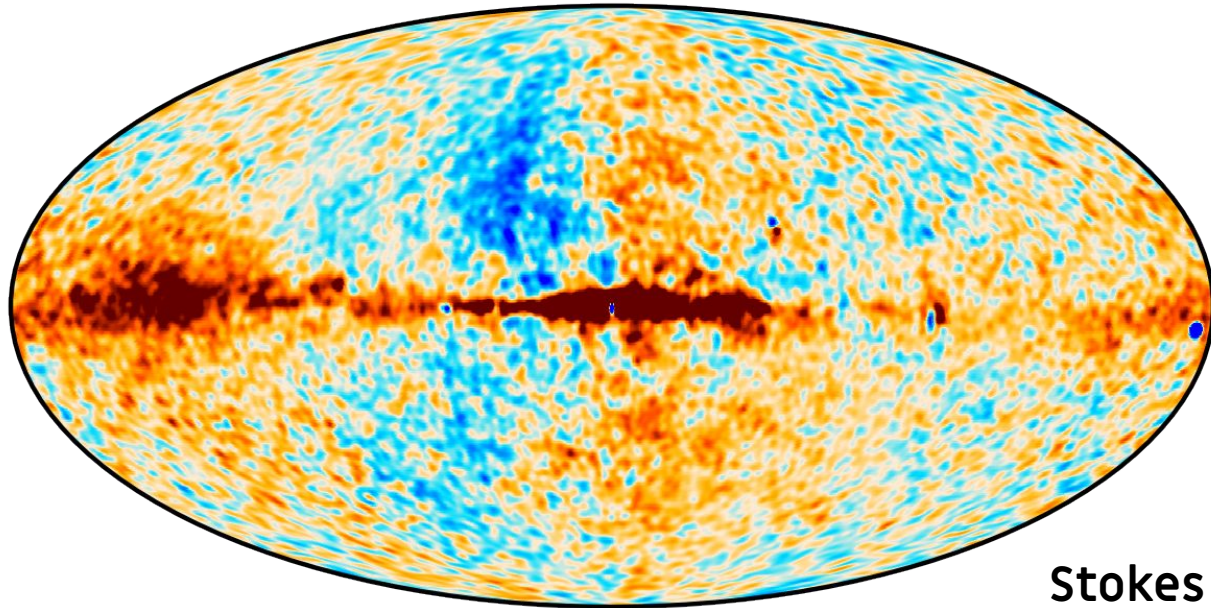
Watts et al. (2023)



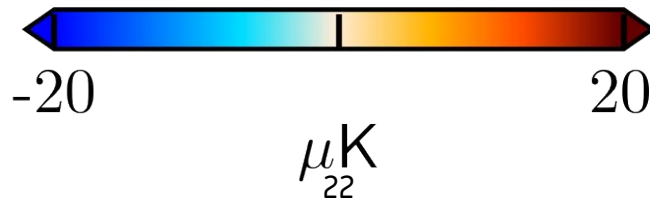


Cosmoglobe DR1: WMAP reanalysis

Q-band (41 GHz) Cosmoglobe WMAP

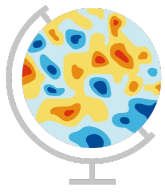


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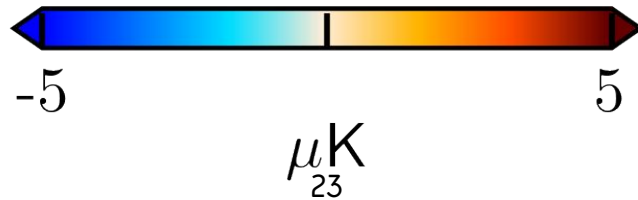
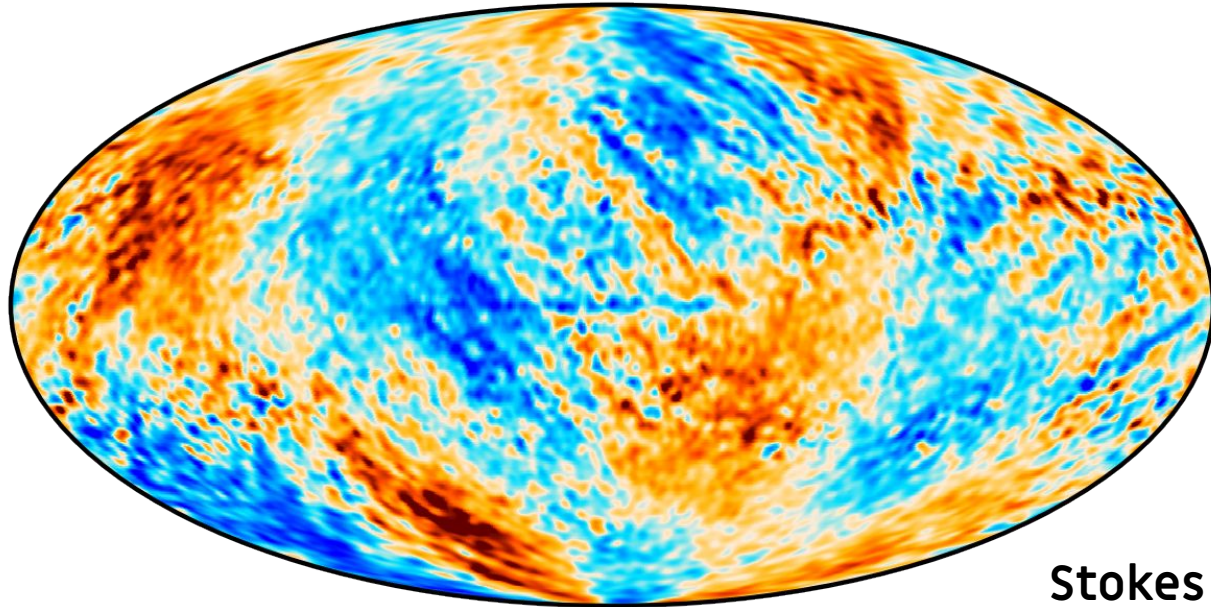
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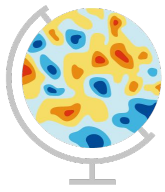


Cosmoglobe DR1: WMAP reanalysis

WMAP Q-band difference map (Cosmoglobe - 9-year)

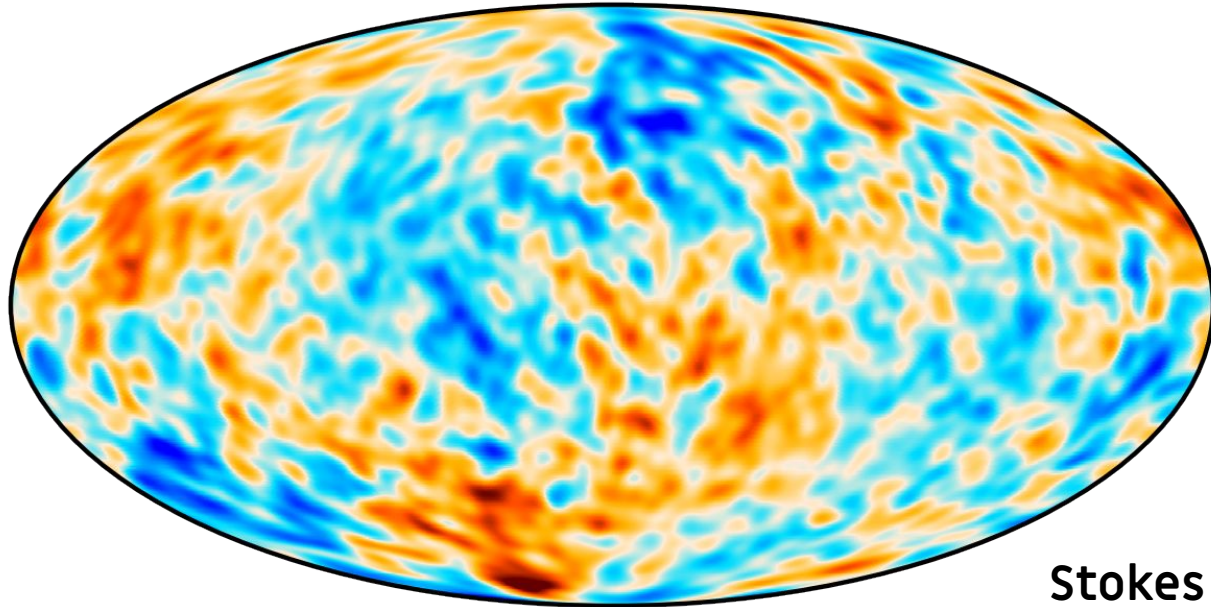


Stokes Q

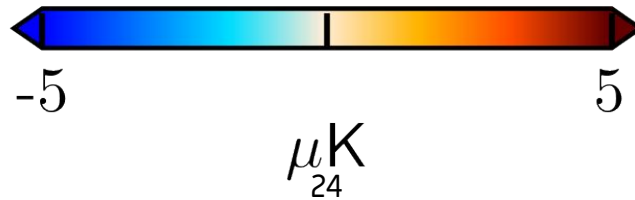


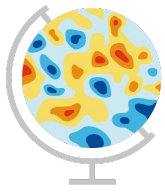
Cosmoglobe DR1: WMAP reanalysis

WMAP Q-band internal detector (Q1-Q2)/2 difference map: 9-year



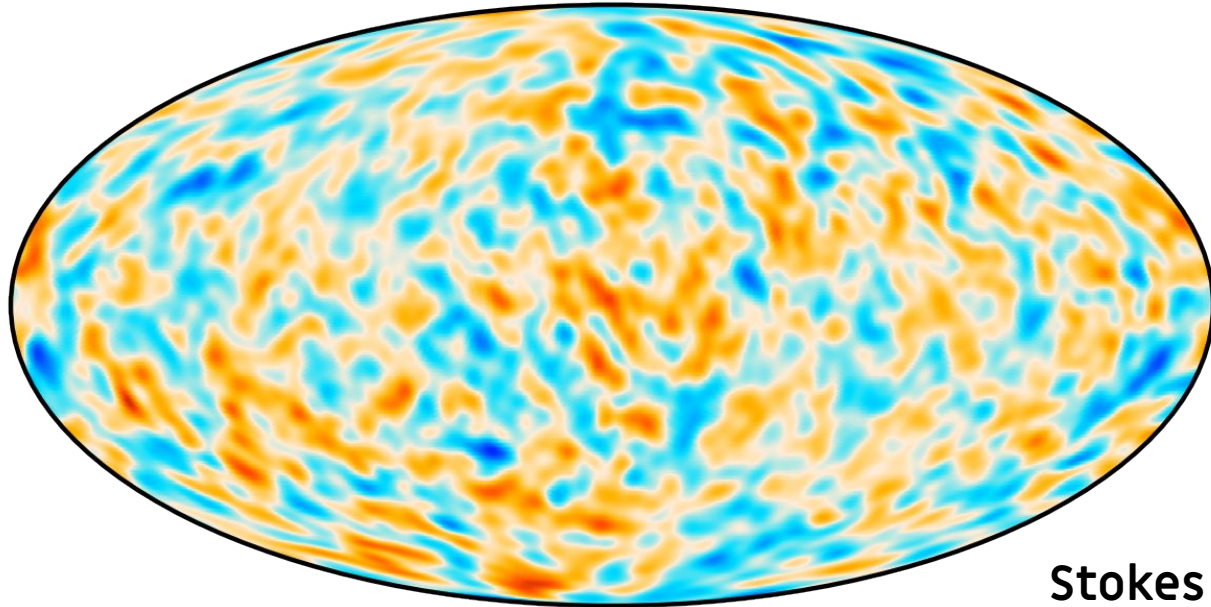
Stokes Q



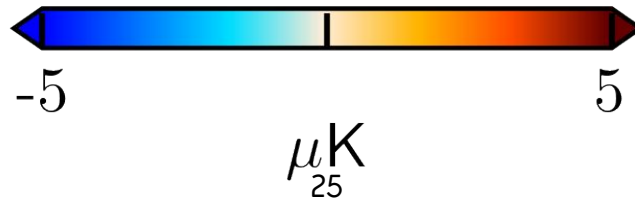


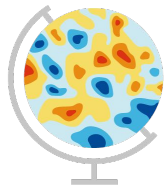
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WMAP Q-band internal detector (Q1-Q2)/2 difference map: Cosmoglobe



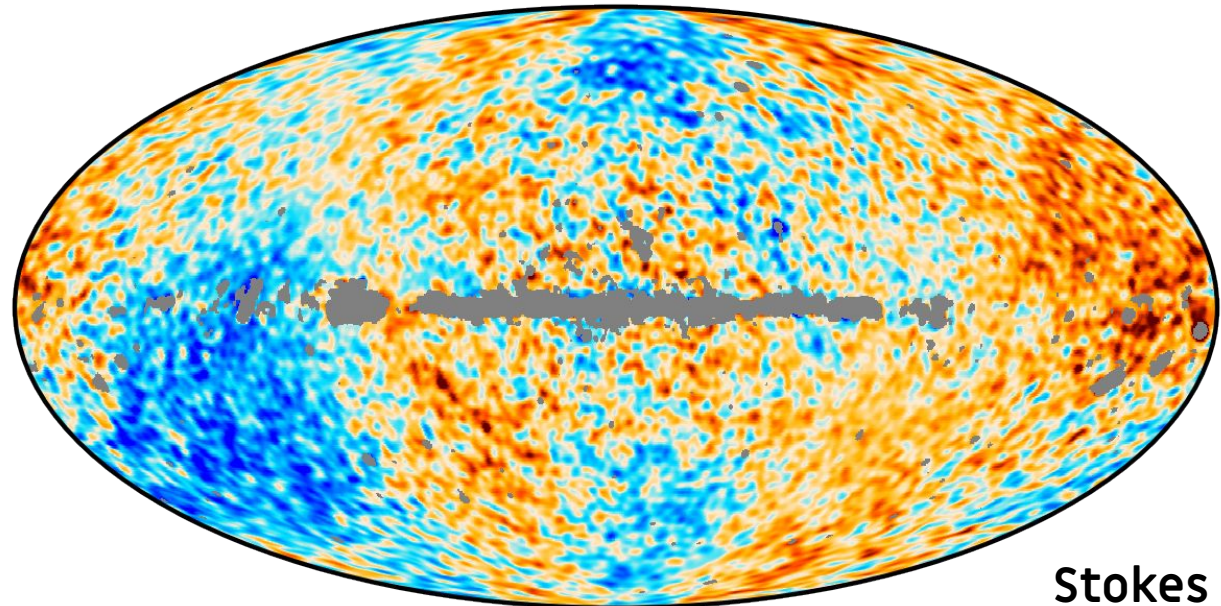
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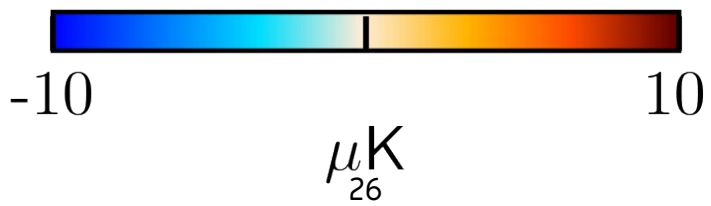


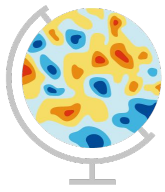
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WMAP 9-year - Planck legacy



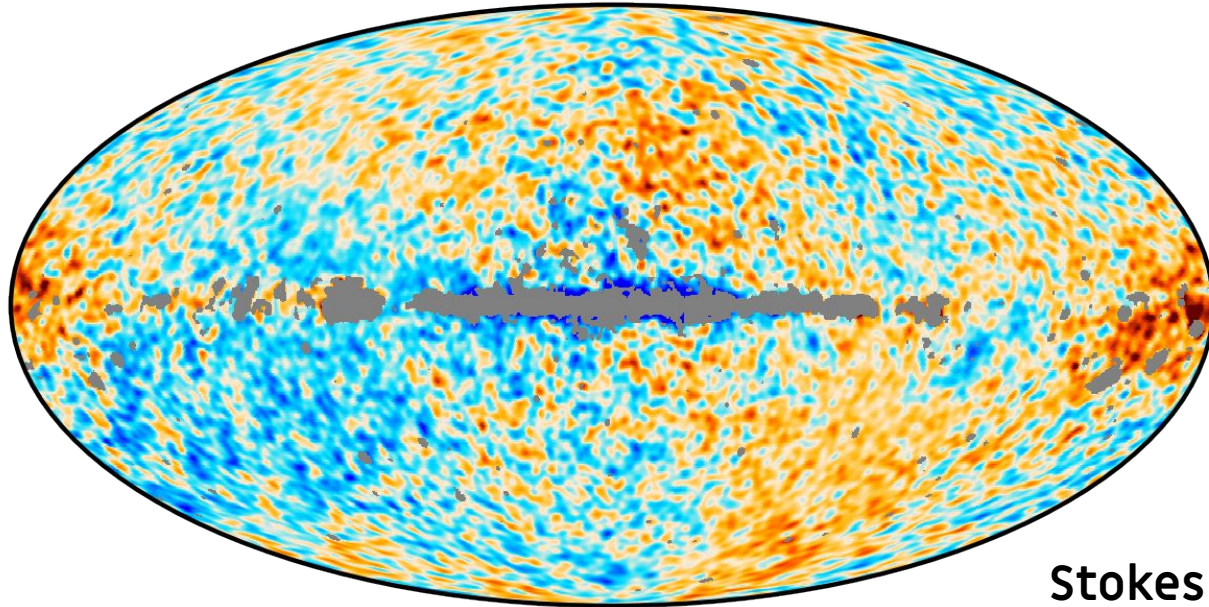
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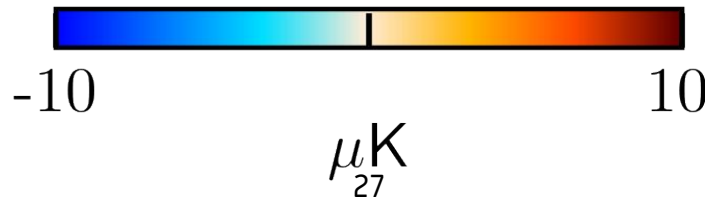


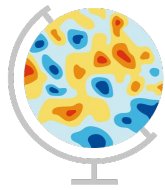
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WMAP 9-year - BeyondPlanck



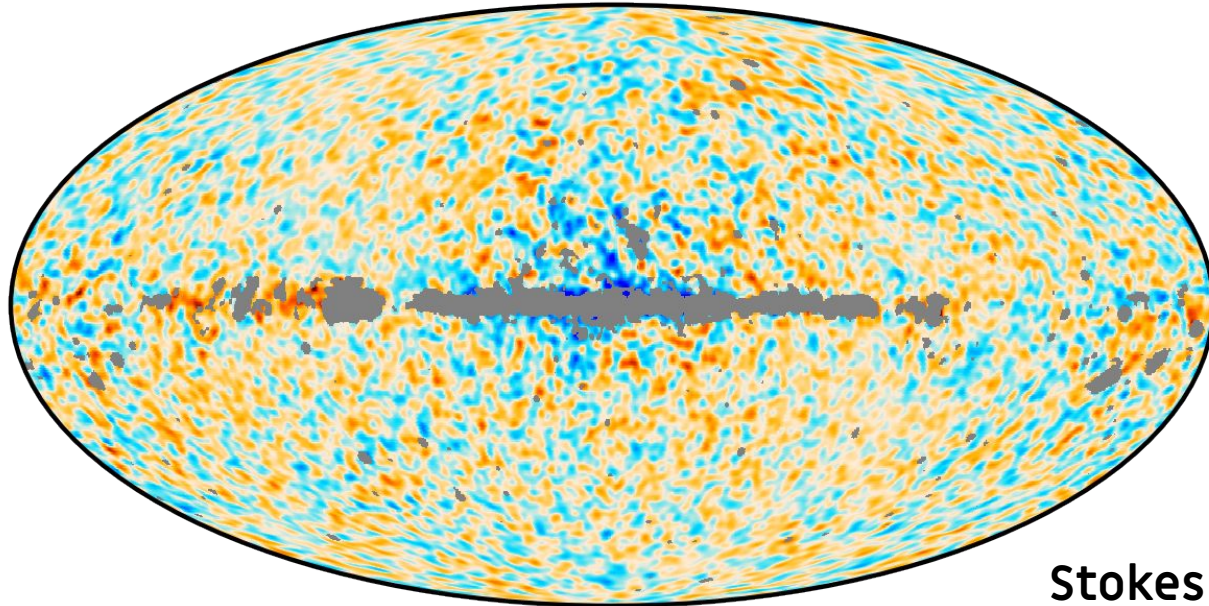
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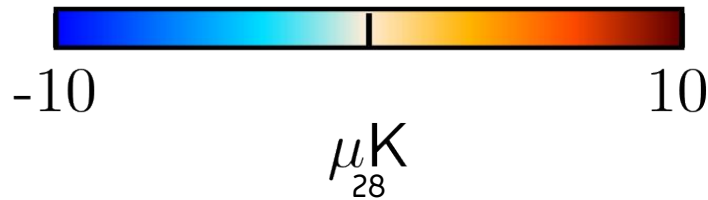


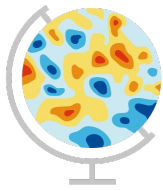
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Cosmoglobe WMAP - Cosmoglobe LFI

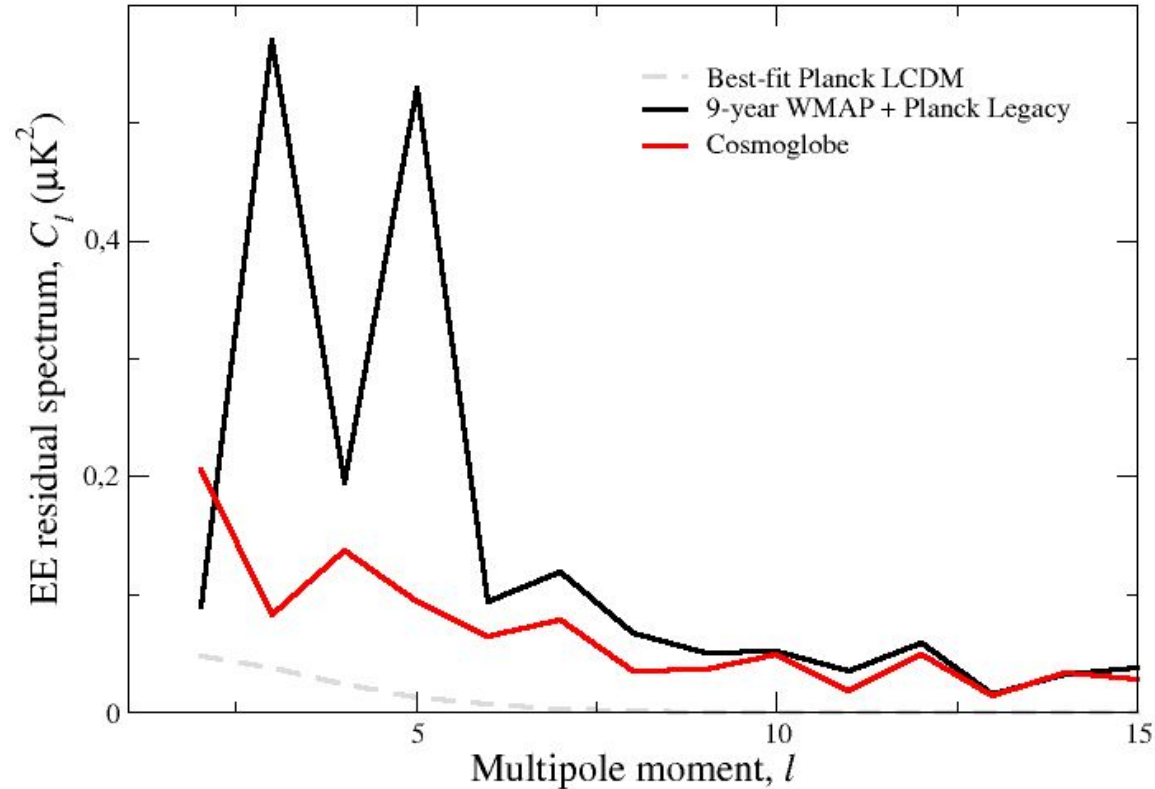


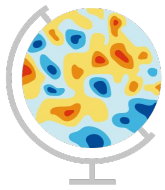
Stokes Q





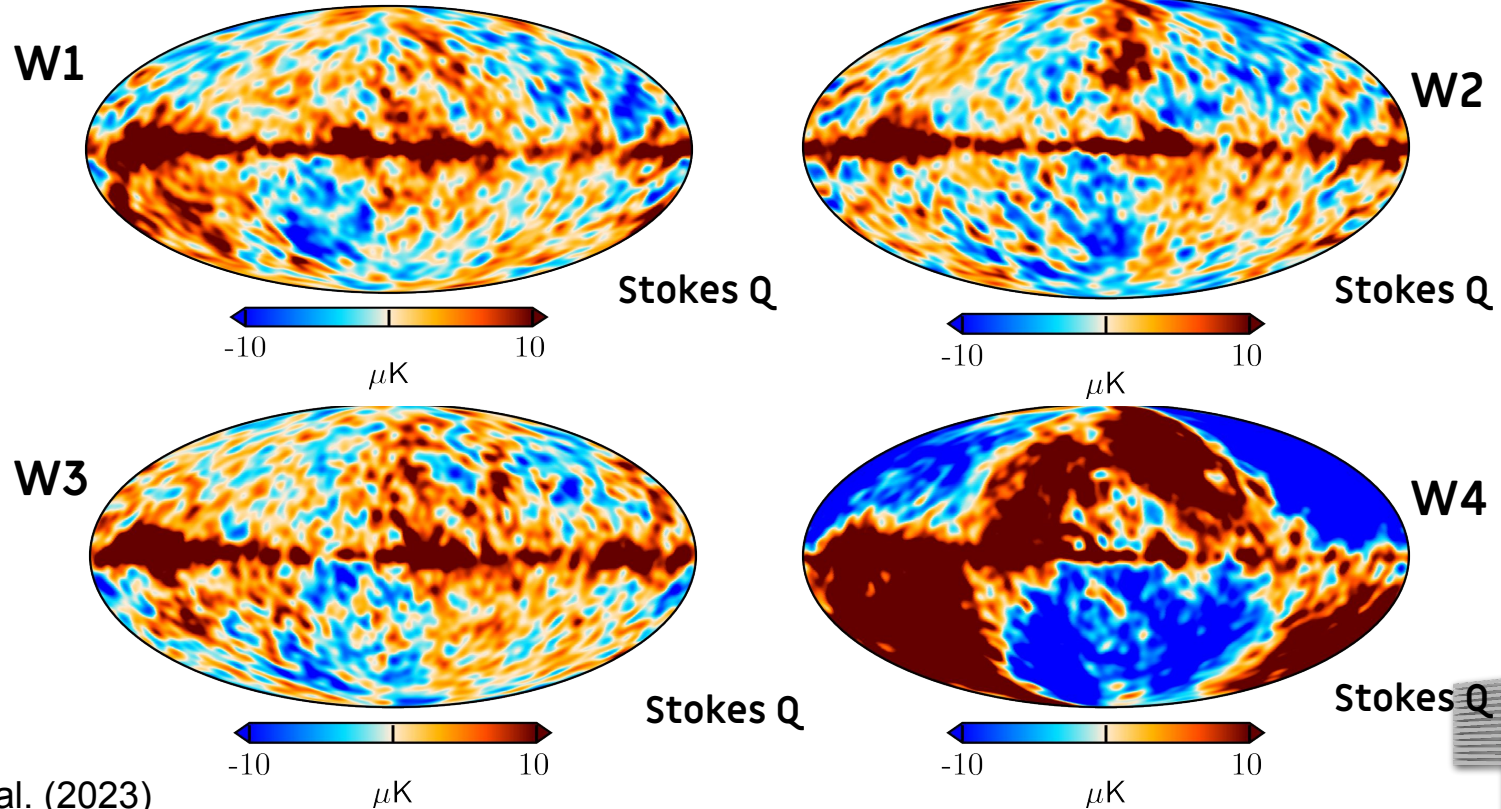
WMAP 23 GHz - Planck 30 GHz: Difference map spectra





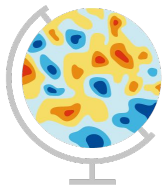
Cosmoglobe DR1: WMAP reanalysis

W-band (94 GHz) 9-year WMAP detector maps



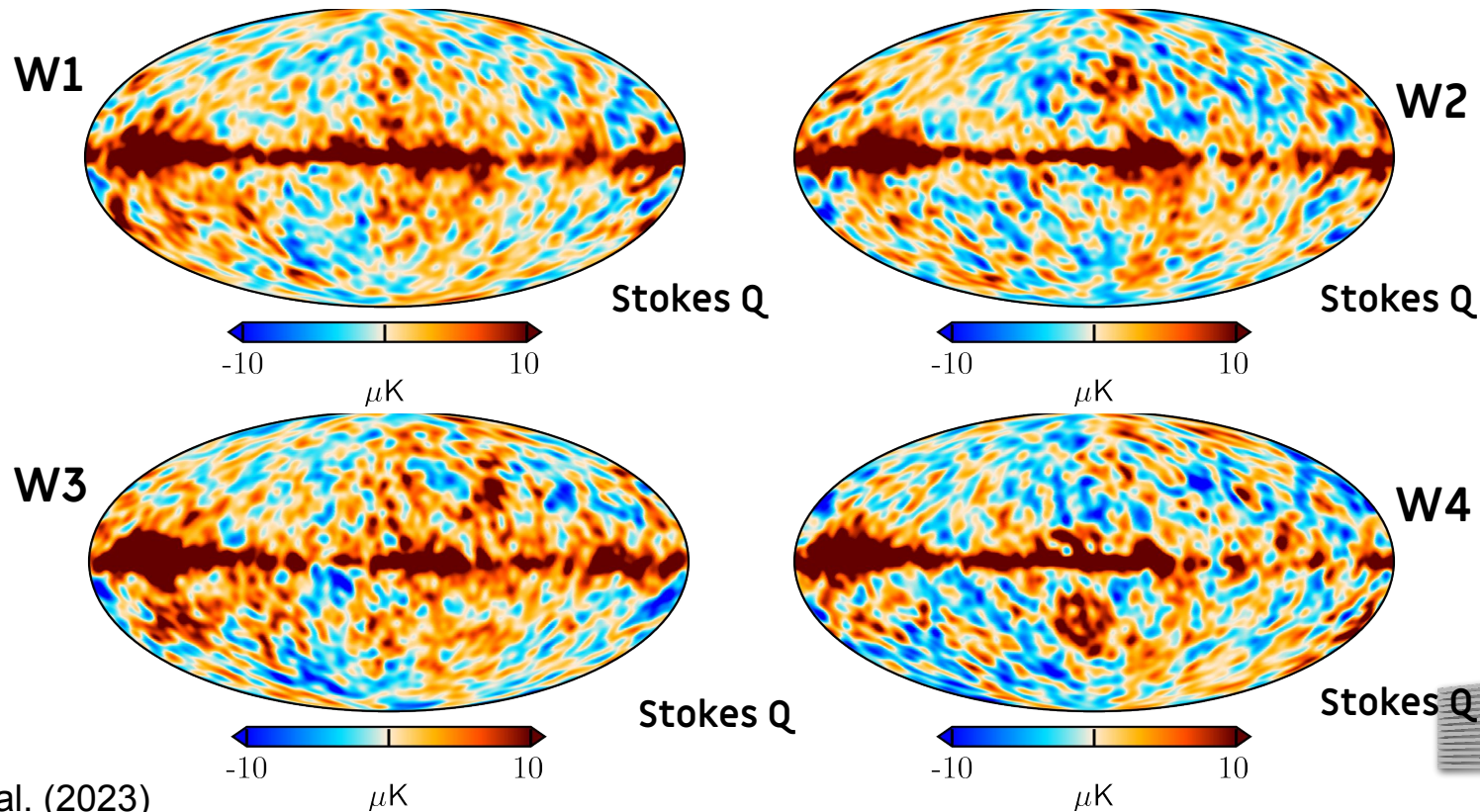
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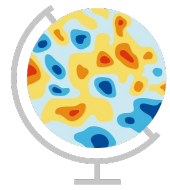
Cosmoglobe DR1: WMAP reanalysis

W-band (94 GHz) Cosmoglobe WMAP detector maps



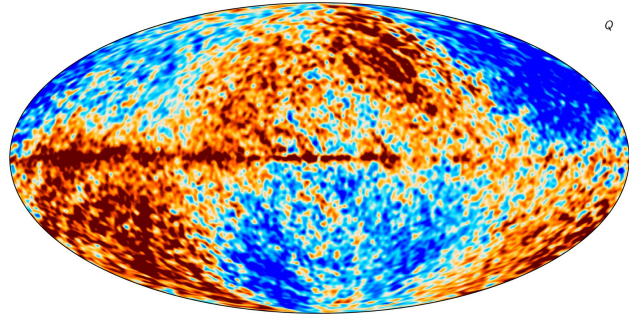
Watts et al. (2023)



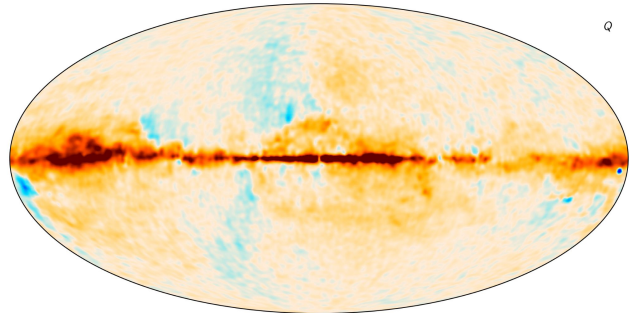


WMAP W-band minus Planck PR4 100 GHz

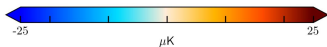
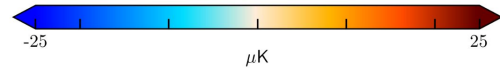
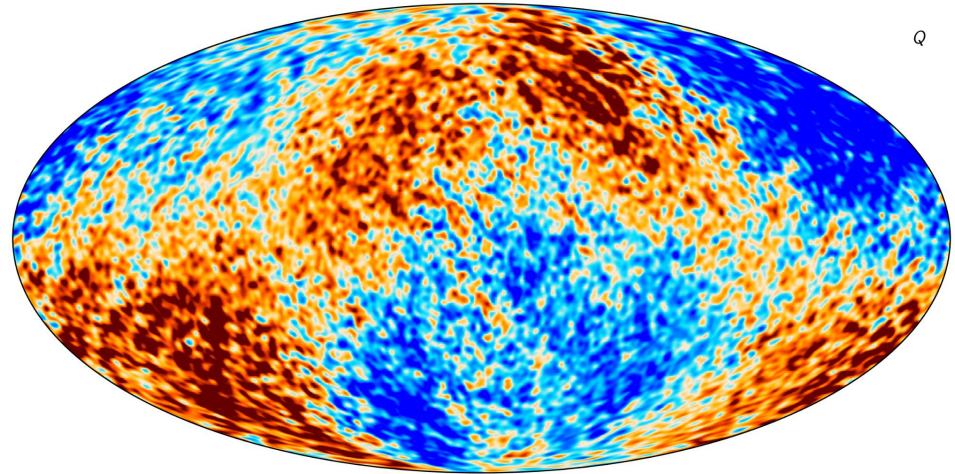
WMAP 9-year (90 GHz)

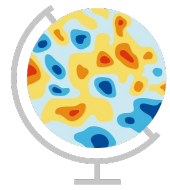


Planck PR4 (100 GHz)



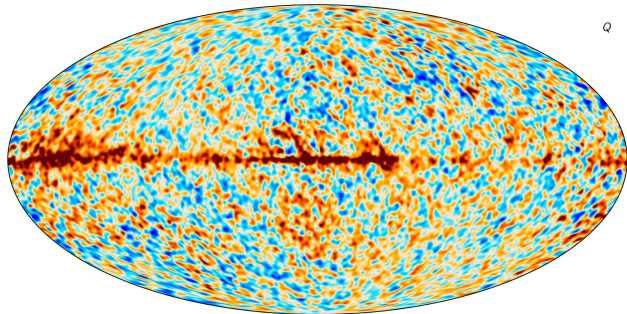
Difference



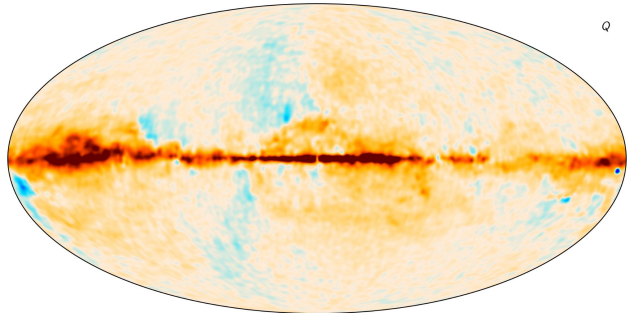


WMAP W-band minus Planck PR4 100 GHz

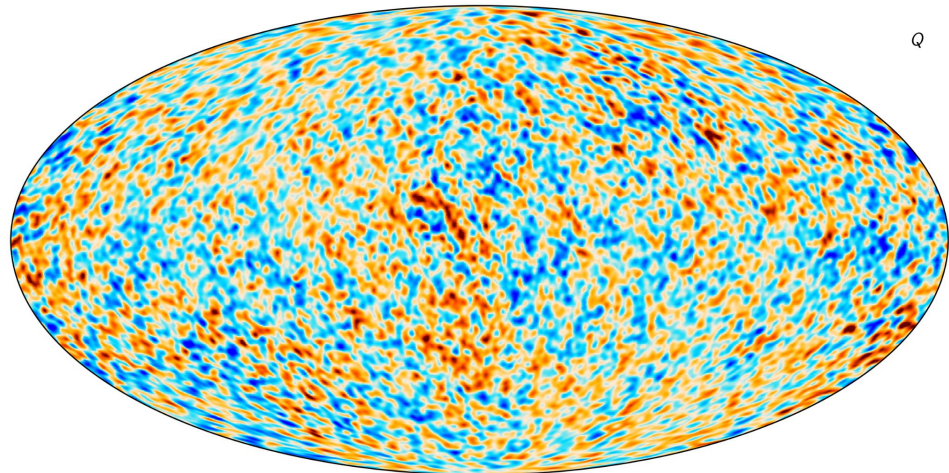
Cosmoglobe (90 GHz)

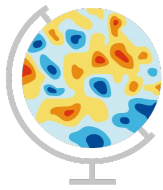


Planck PR4 (100 GHz)

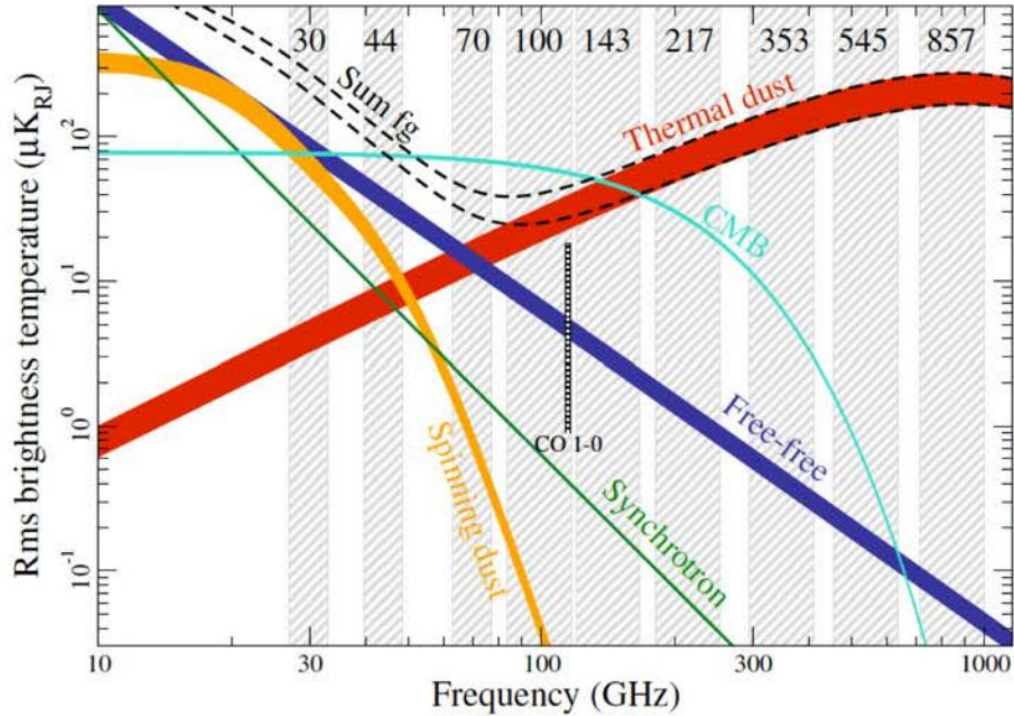


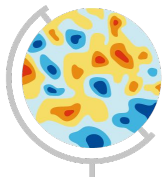
Difference



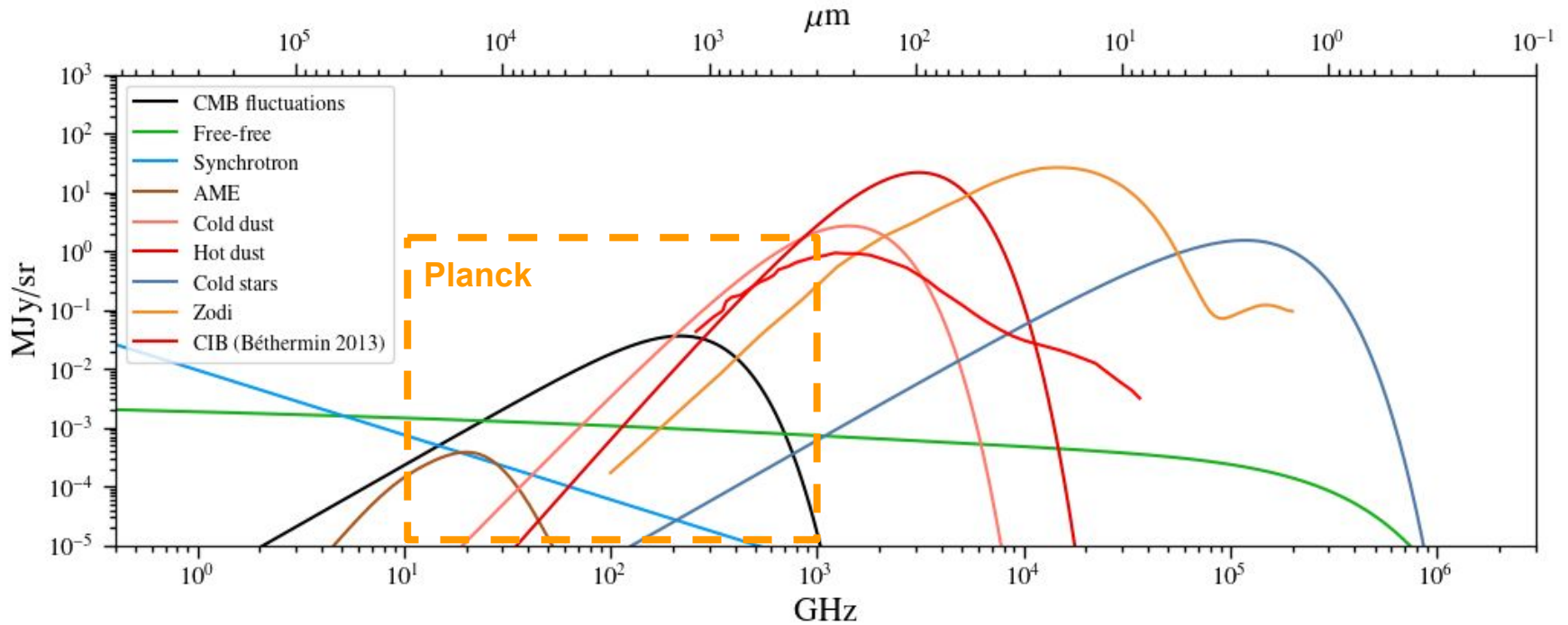


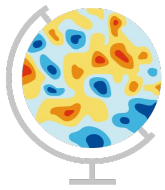
Cosmoglobe DR1: The CMB frequency range





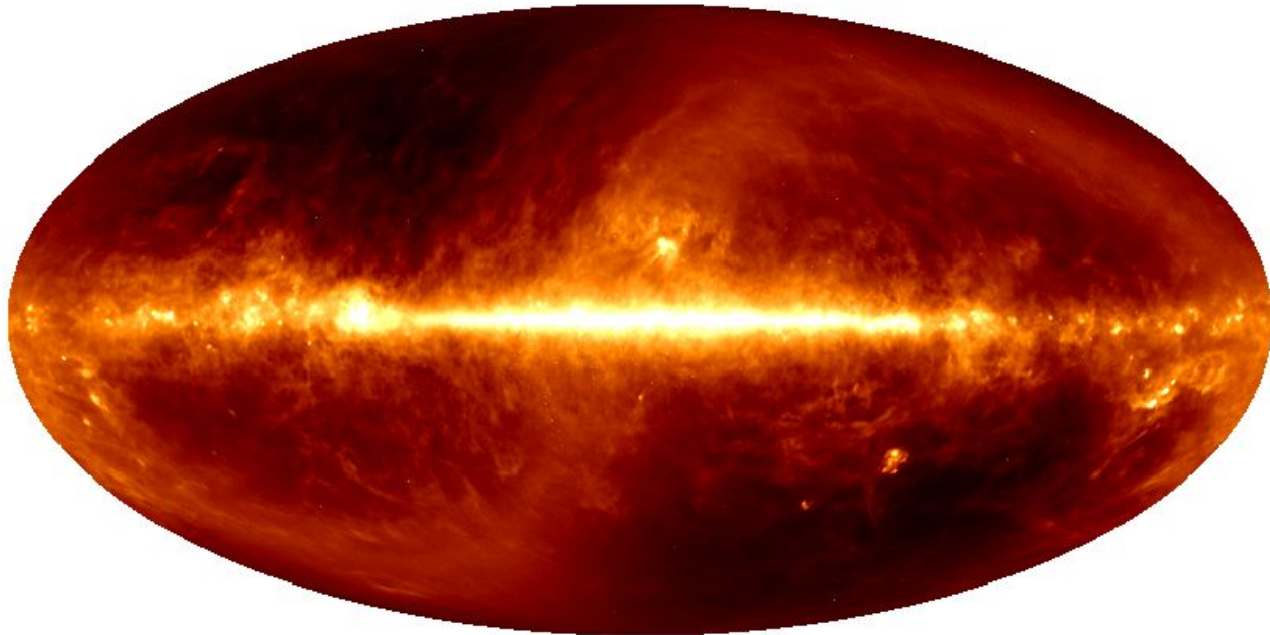
Cosmoglobe DR2: Sub-mm and infrared frequencies





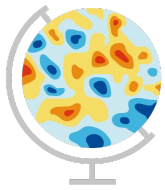
Cosmoglobe DR2 preview: DIRBE reanalysis

DIRBE 100 μ m map

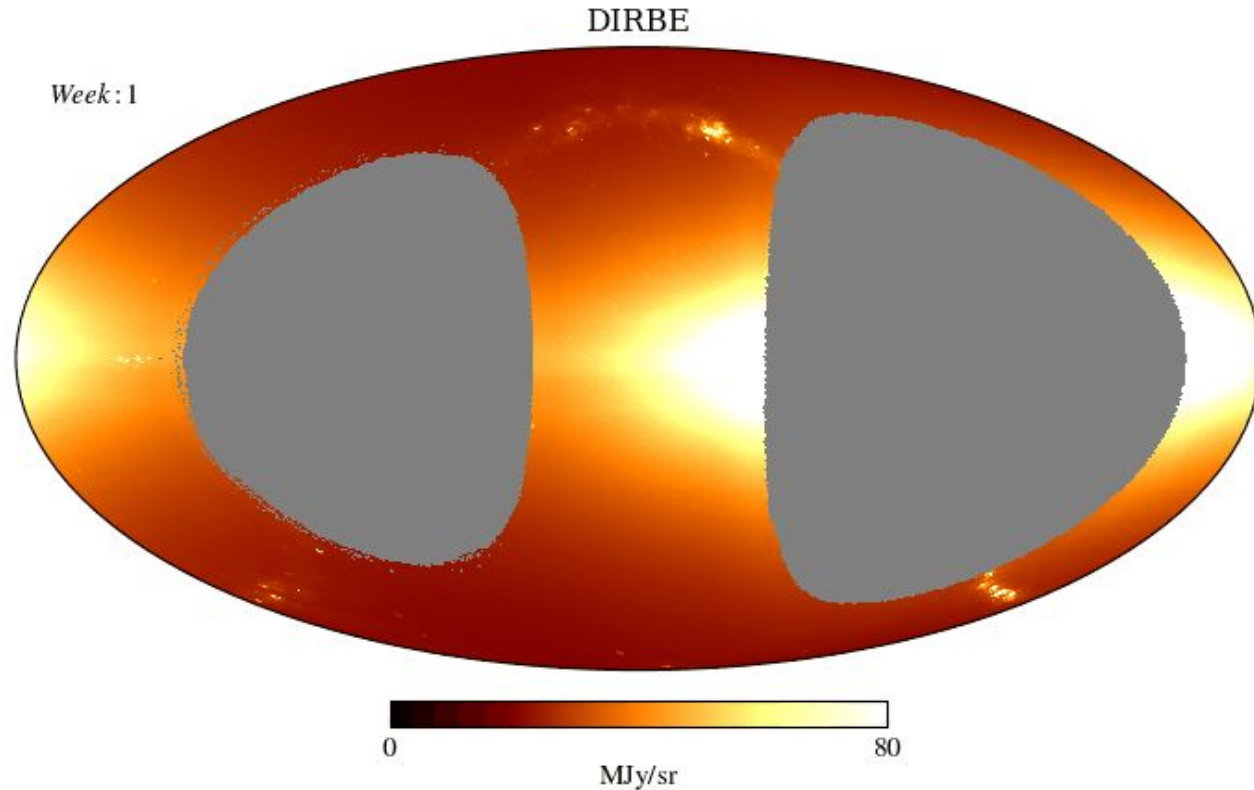


San et al. (2023), in preparation



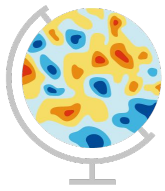


Major new feature: Time-domain Zodiacal light modeling



San et al. (2024), in preparation

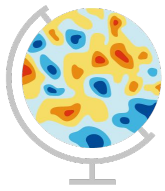




Cosmoglobe DR2 data

- **DIRBE: TODs for 10 frequencies between 1.25 and 240 μm**
- Planck HFI DR4: Maps for 100 - 857 GHz
 - Pre-subtracted CMB and zodiacal light emission
- FIRAS: Low-resolution maps, included for cross-checking calibration
- (If necessary and given enough time, we have very recently secured IRAS Level 1 data from IPAC on disk in Oslo, which could help with improving angular resolution to ~ 1 arcmin between 12 and 100 μm)



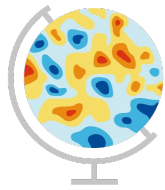


Cosmoglobe DR2 model

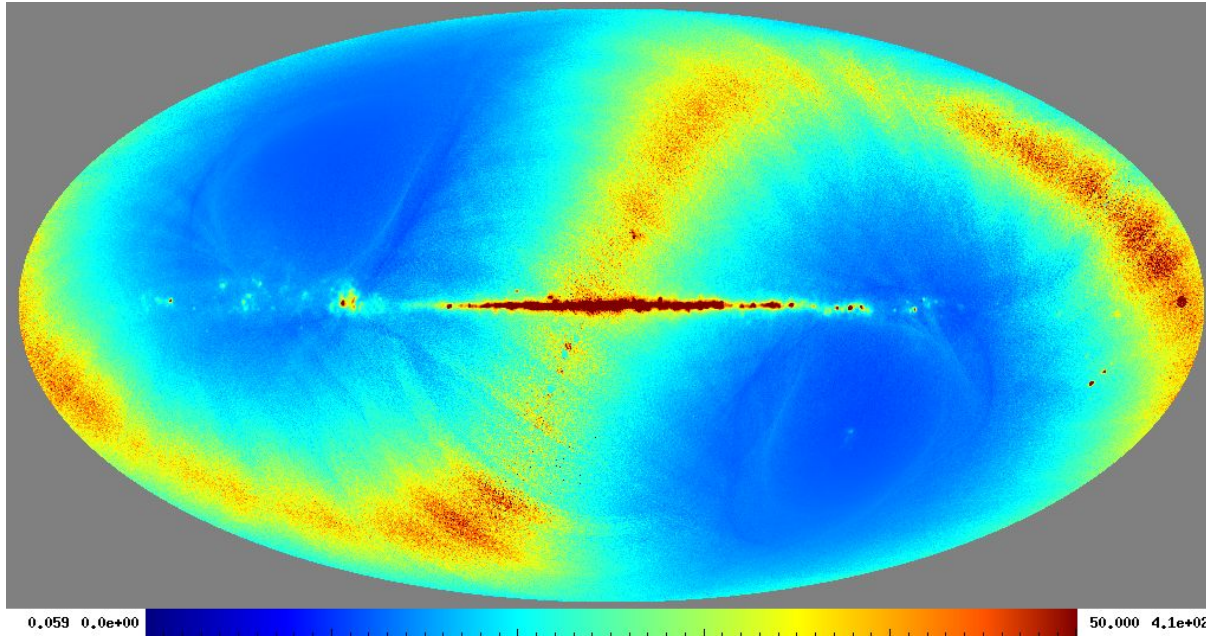
Current data model includes:

- Six-component time-domain zodiacal light model (Kelsall et al. 1998):
 - Cloud
 - Three asteroid bands
 - Circumsolar ring + Earth-trailing feature
- Three thermal dust components with constant spectral indices:
 - Local dust traced by Edenhofer et al. 3D template
 - Distant HI correlated dust
 - Distant CII correlated dust
- WISE catalog of ~240k stars, fixed position, but free amplitude and spectral index per star
- Free-free emission given by Planck 2015 model



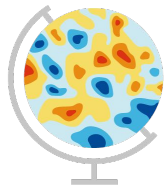


Example: Decomposing DIRBE 12 μm

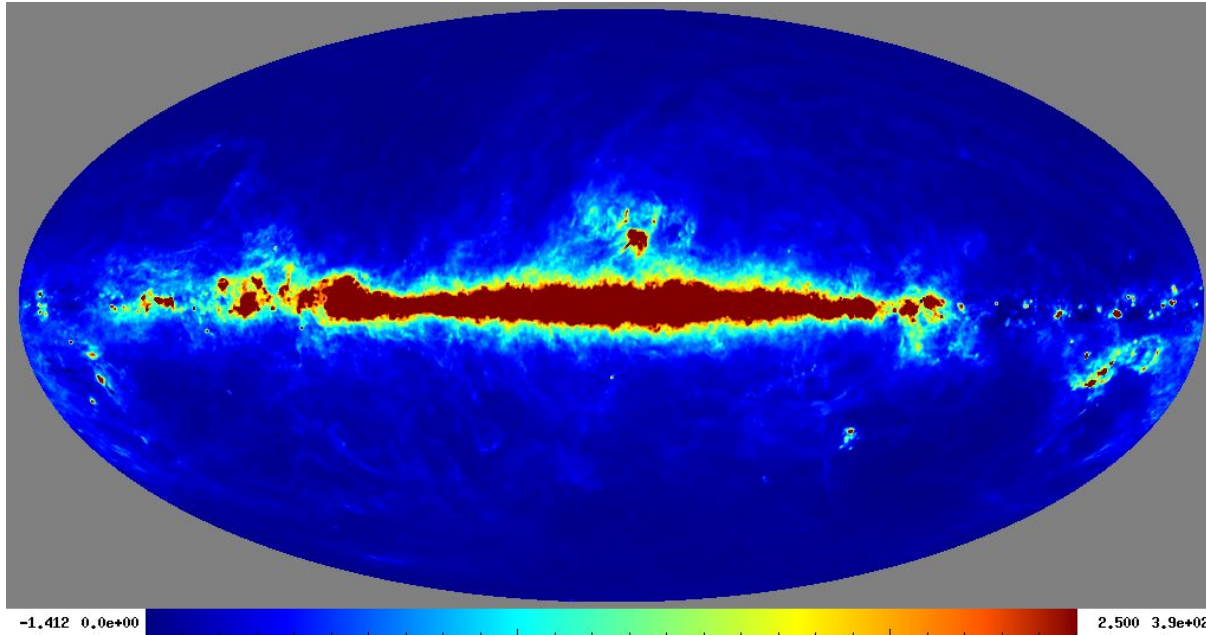


Color scale: ± 50 MJy/sr

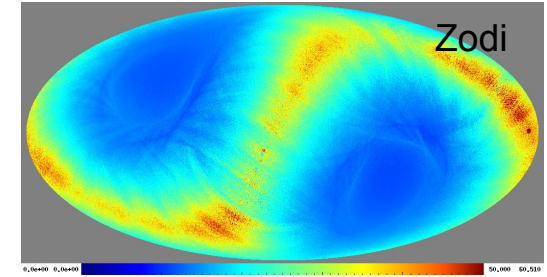


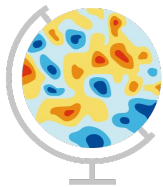


Example: Decomposing DIRBE 12 μm

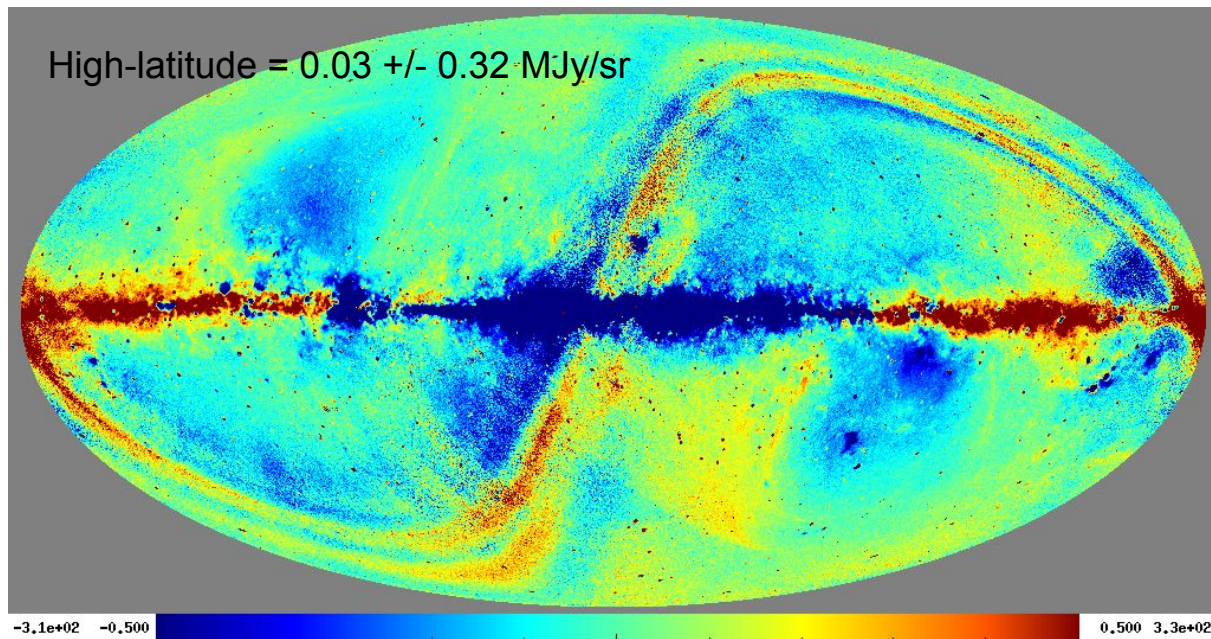


Color scale: +/- 2.5 MJy/sr

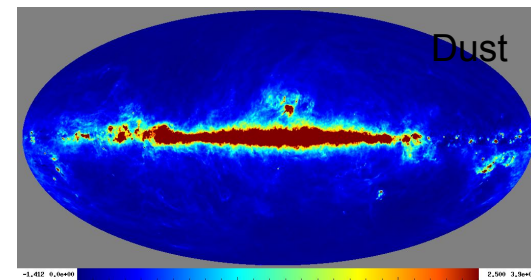
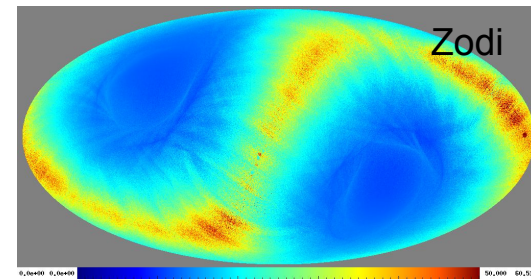


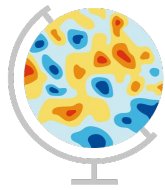


Example: Decomposing DIRBE 12 μm

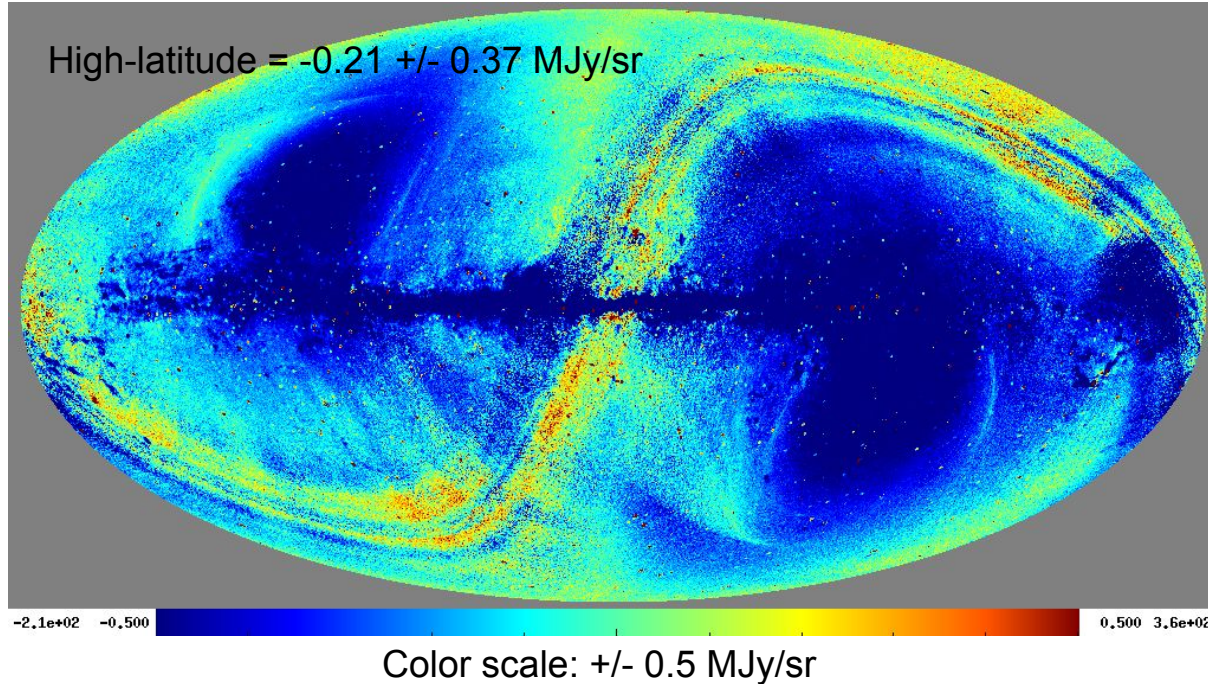


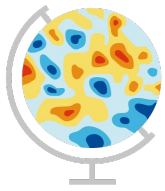
Color scale: ± 0.5 MJy/sr



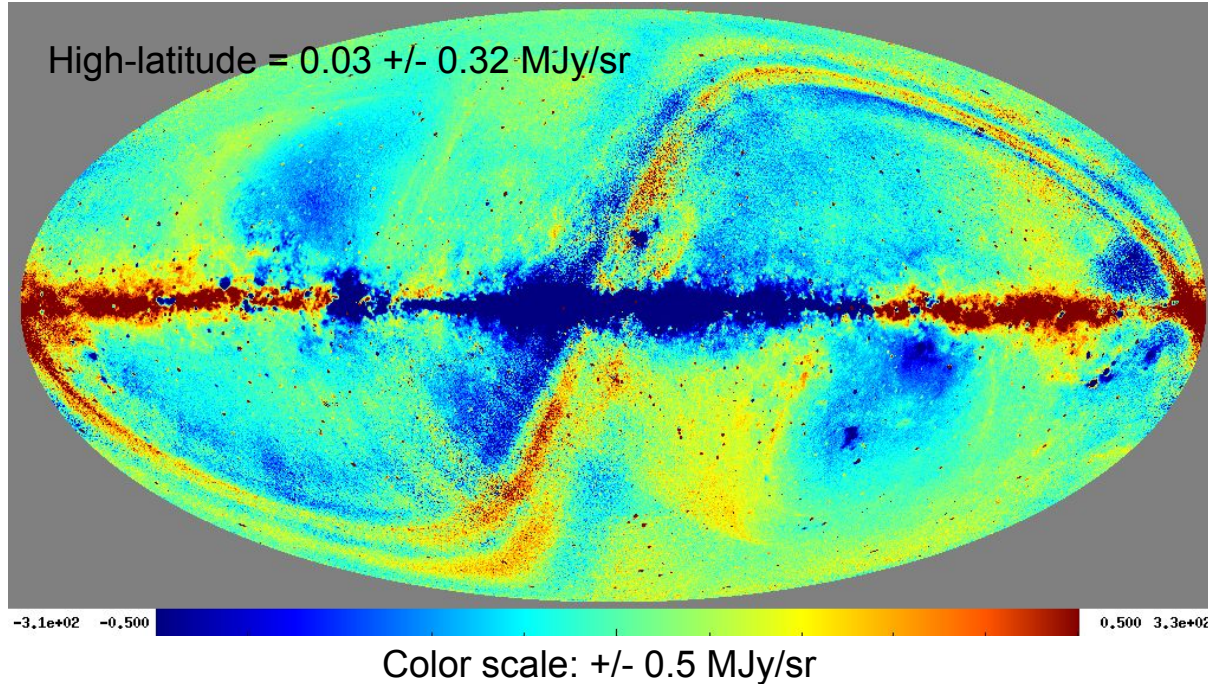


DIRBE 12 μm residual with Kelsall et al. (1998) model





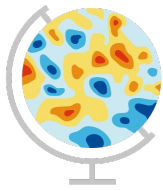
Example: Decomposing DIRBE 12 μm



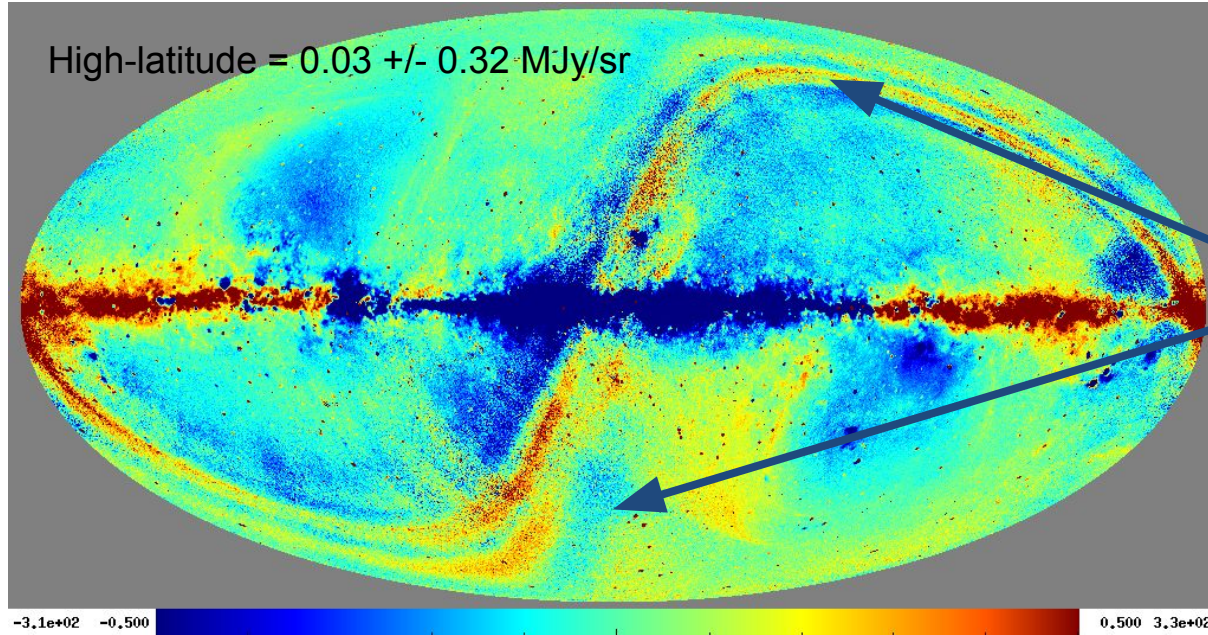
Same parametric model used in both cases

Commander improvements comes exclusively from better fitting algorithms (using TOD, all data, joint foregrounds etc.)





Example: Decomposing DIRBE 12 μm

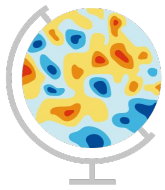


Cannot fit asteroid bands properly with K98 model

Need to add more components (bands, rings etc.) as seen by IRAS to the parametric model to dig much deeper

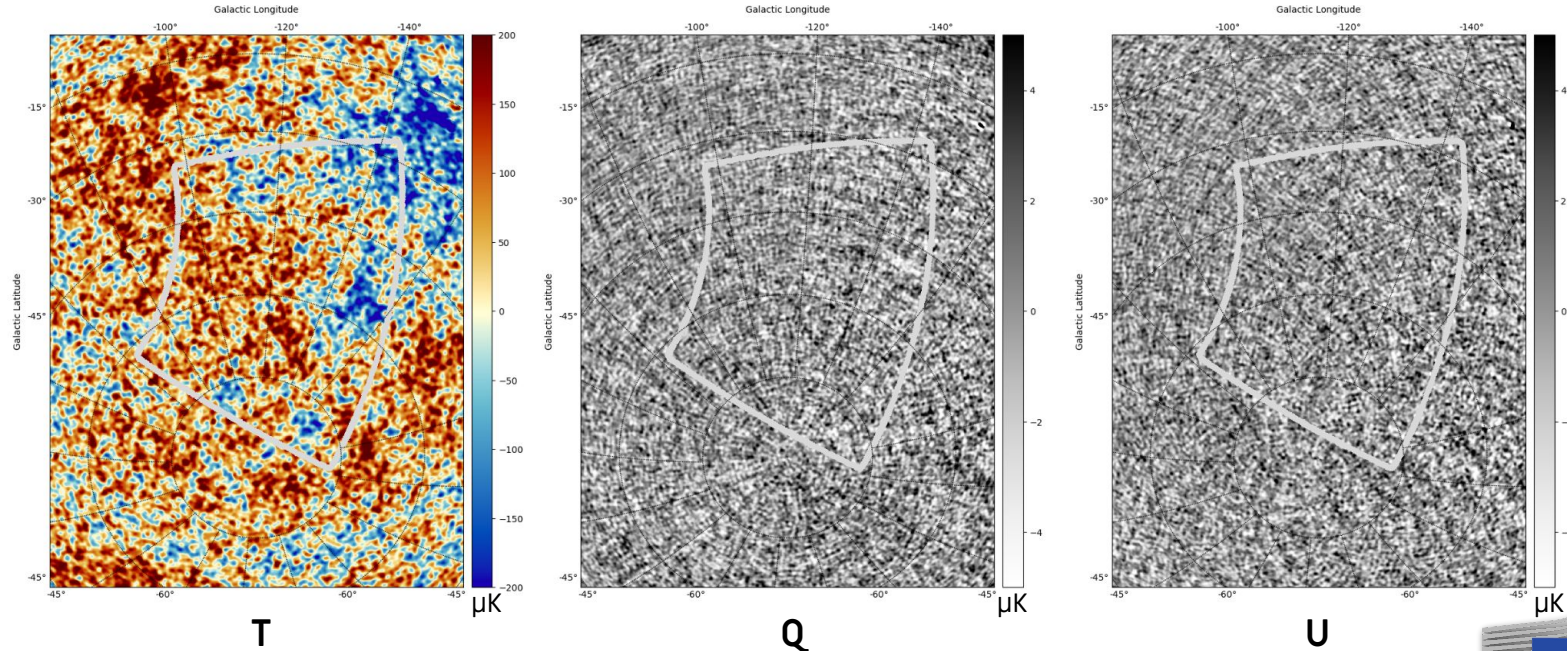
Color scale: +/- 0.5 MJy/sr





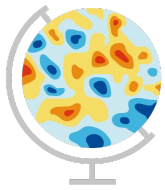
On-going: SPIDER – first demonstration of partial sky analysis

Joint Planck + WMAP + Haslam analysis (without SPIDER)



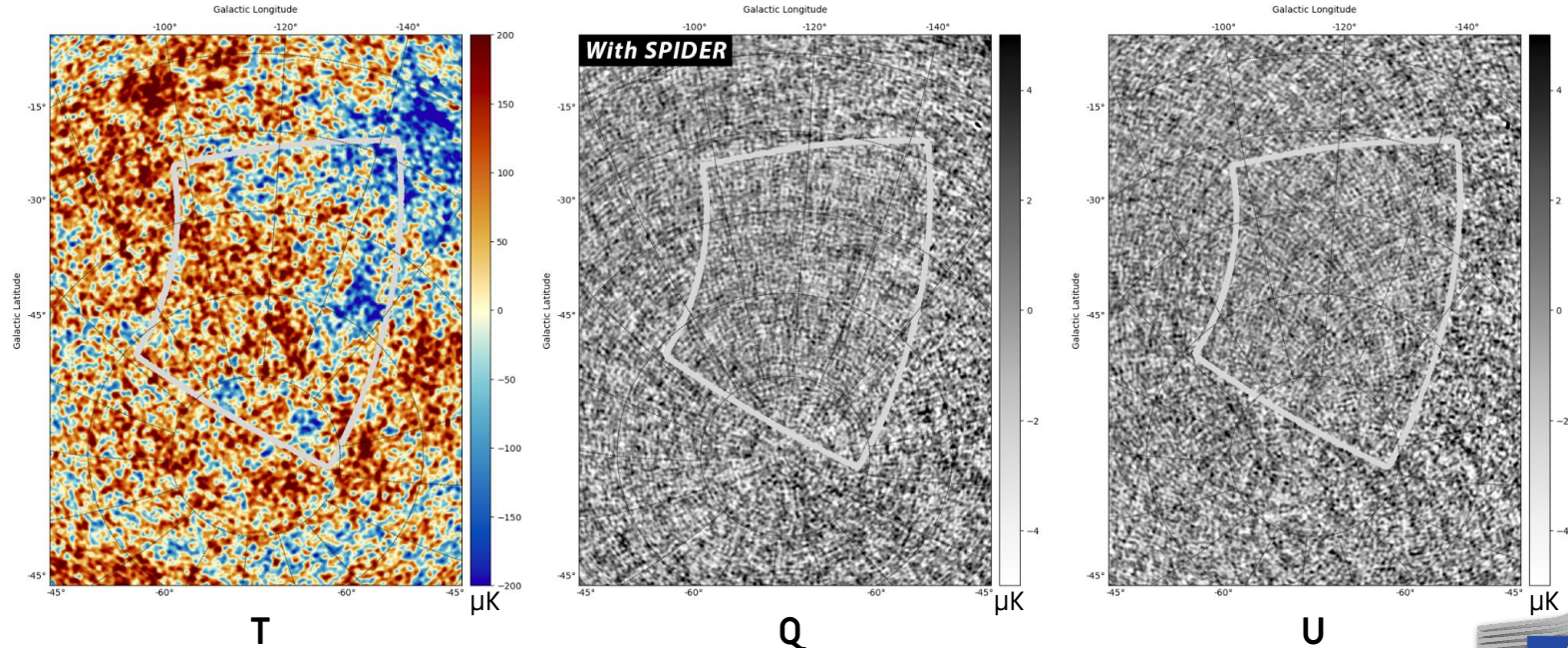
Thommesen et al. (2023), in preparation





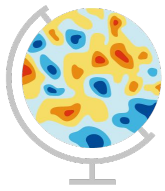
On-going: SPIDER – first demonstration of partial sky analysis

Joint Planck + WMAP + Haslam + SPIDER analysis



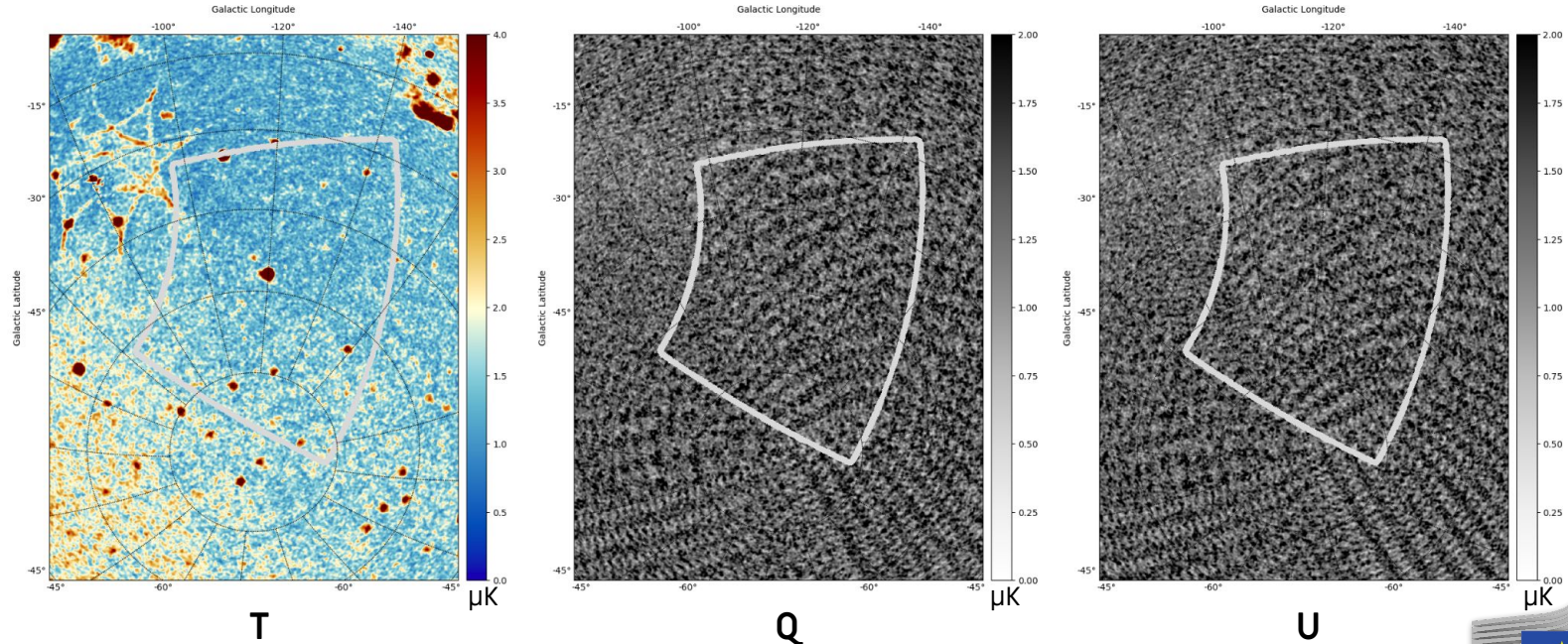
Thommesen et al. (2023), in preparation





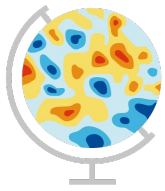
SPIDER – noise uncertainty per pixel

Joint Planck + WMAP + Haslam analysis (without SPIDER)



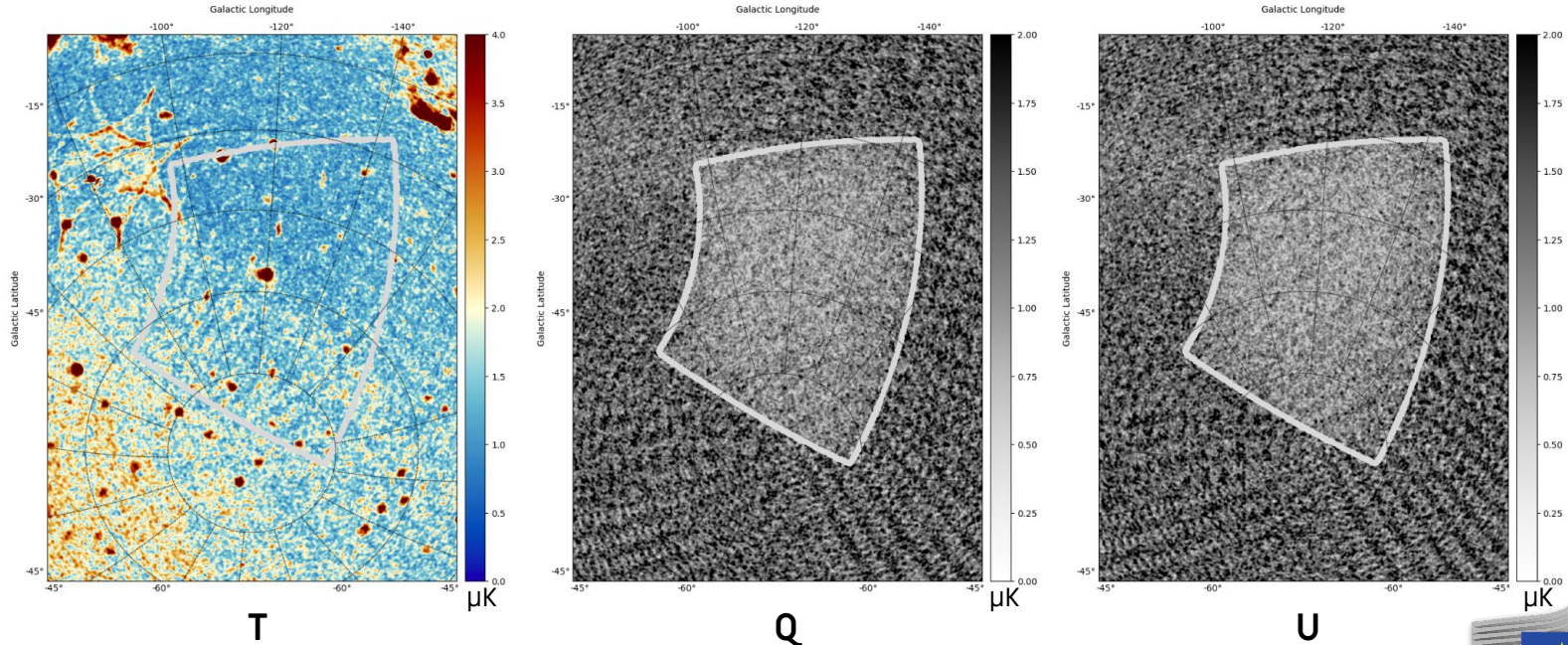
Thommesen et al. (2023), in preparation





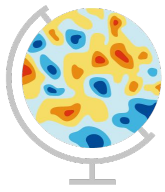
SPIDER – noise uncertainty per pixel

Joint Planck + WMAP + Haslam + SPIDER analysis

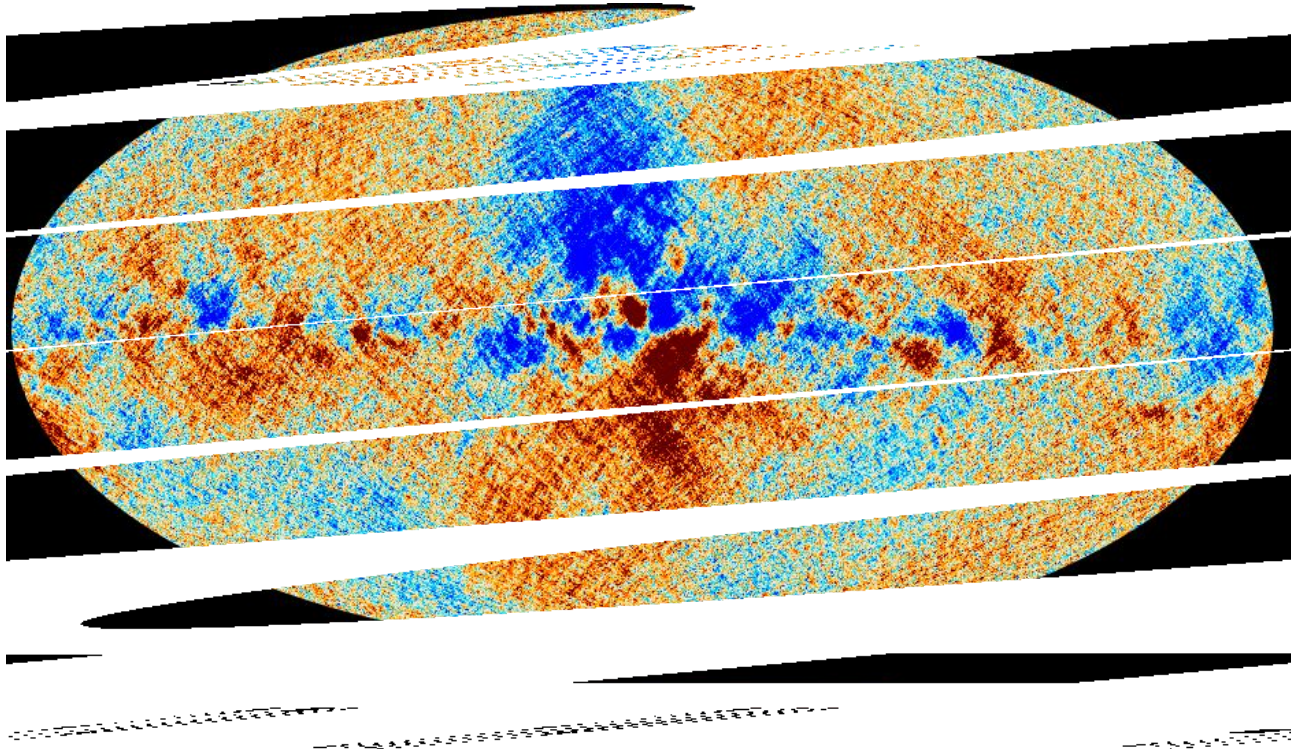


Thommesen et al. (2023), in preparation



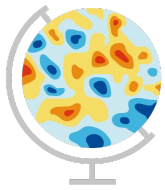


The future: LiteBIRD simulated TOD analysis

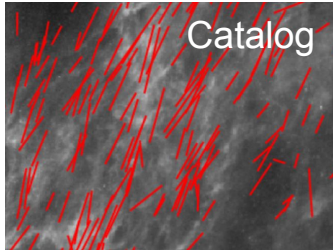


Aurlien et al. (2023), in preparation





Also on-going (but early days) efforts



Catalog

PASIPHAE

Optical 3D starlight polarization



TOD

COMAP

High-res 26-34 GHz spectrometer



TOD

CHIPASS

1.4 GHz survey



Maps

QUIJOTE

11-19 GHz polarization



Maps

C-BASS

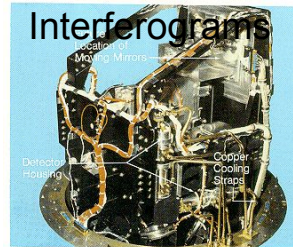
5 GHz all-sky T+P



TOD

Planck HFI

100 - 857 GHz



Interferograms

Test unit being prepared for vibration test. Horn, calibrator, and mirror mechanism are not shown.

COBE-FIRAS

Absolute calibration

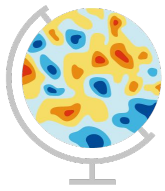


Maps

ACT

High-res T+P

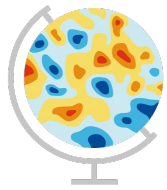




Global analysis summary

- Joint end-to-end analysis needed to constrain correlated parameters
- Joint analysis of independent experiments break each other degeneracies
- Joint analysis give more complete noise characterization
- Single pipeline is fast and effective and require less human interaction





Funding

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- **bits2cosmology**
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- **BeyondPlanck**
 - EU COMPET-4 Grant agreement No. 776282 - PI H. K. Eriksen - 2018-2020
- **Global Component Separation Network**
 - Diku/RCN INTPART Grant agreement No. 274990 - PI I. K. Wehus - 2018-2023



Useful papers for readers interested in general Bayesian CMB analysis

- First proposals of Bayesian CMB Gibbs sampling
 - Jewell et al. (2004; arxiv:0209560), Wandelt et al. (2004; 0310080)
- Commander1: First high-resolution CMB Gibbs sampling implementation
 - Eriksen et al. (2004; arxiv:0407028)
- First joint CMB and foreground sampler (pixel-by-pixel)
 - Eriksen et al. (2008; arxiv:0709.1058)
- Global sky model from Planck derived with Commander
 - Planck collaboration (2016; arxiv:1502.01588)
- Commander2: First multi-resolution CMB Gibbs sampler
 - Seljebotn et al. (2019; arxiv: 1710.00621)
- Commander3: First TOD-based CMB Gibbs sampler and application to LFI
 - BeyondPlanck collaboration (2020; arxiv:2011.05609)
- Cosmoglobe DR1: First CMB multi-experiment analysis (LFI+WMAP)
 - Watts et al. (2023; arxiv:2303.08095)

Technical papers for specially interested readers

- Bayesian TOD-level **noise estimation**
 - Wehus et al. (2012; arxiv:1110.1343)
 - Ihle et al. (2023; arxiv:2011.06650)
- Fast and optimal **CMB map-making** by Gibbs sampling
 - Keihänen et al. (2023; arxiv:2011.06024)
- Bayesian **gain estimation**
 - Gjerløw et al. (2023; arxiv:2011.08082)
- Bayesian **bandpass estimation** and correction
 - Svalheim et al. (2023; arxiv:2201.03417)
- Integrated **cosmological parameter estimation**
 - Jewell et al. (2008; arxiv:0807.0624) – first proposal
 - Racine et al. (2017; arxiv:1512.06619) – breaking the low S/N degeneracy
 - Eskilt et al. (2023; arxiv:2306.15511) – first integrated Commander implementation

For more information, see cosmoglobe.uio.no