

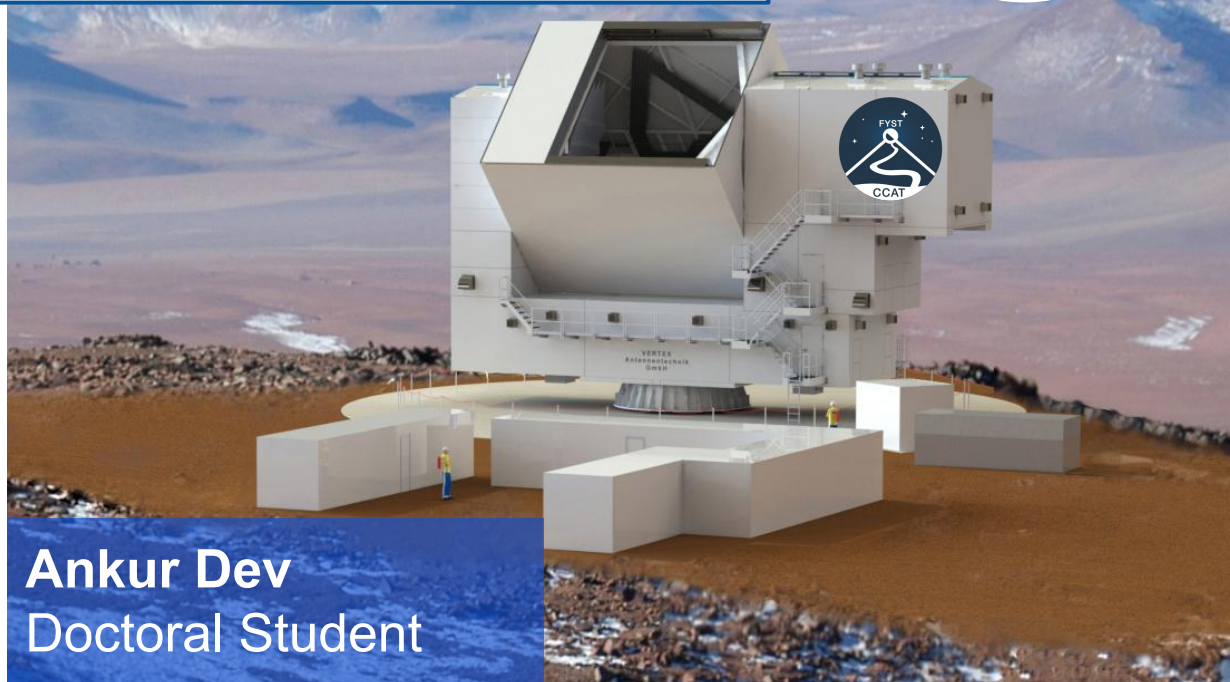
Spectral Datacube Cleaning for CCAT Deep Spectroscopic Survey



IMPRS
astronomy &
astrophysics
Bonn and Cologne



Argelander-
Institut
für
Astronomie

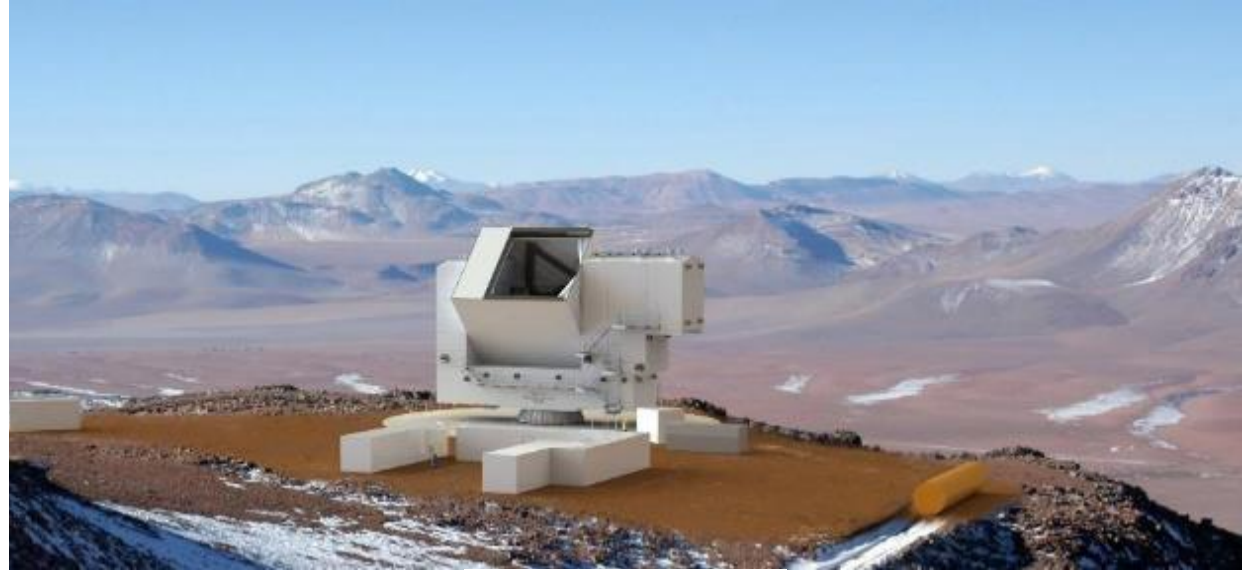


Ankur Dev
Doctoral Student

In collaboration with:

Christos Karoumpis¹ ;
Dongwoo Chung³ ; Frank
Bertoldi¹ ; Gordon Stacey³
; Jonathan Clarke² ;
Kaustuv Basu¹ ; Rodrigo
Freundt³ ; Tejas Oak¹ ;
Thomas Nikola³ ; Yoko
Okada²
+ CCAT Collaboration

¹ University of Bonn,
² University of Cologne,
³ Cornell University



Canadian Consortium

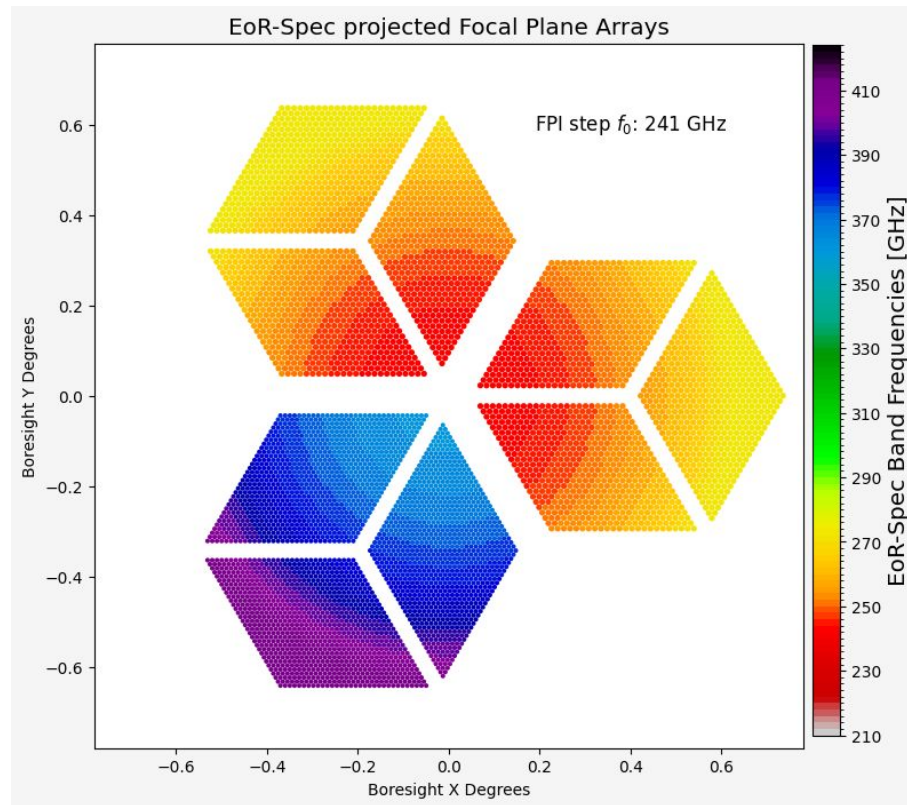


EoR-Spec Detector Arrays

Each FPI setting allows simultaneous spectral and spatial multiplexing

- 2 frequency bands, 210-315 GHz (two LF arrays) and 315-420 GHz (one HF array)
- FPI 2nd and 3rd order resonance modes observed simultaneously by low and high freq arrays respectively

Fig: Mock EoR-Spec simulation for an FPI step, built on TOAST framework



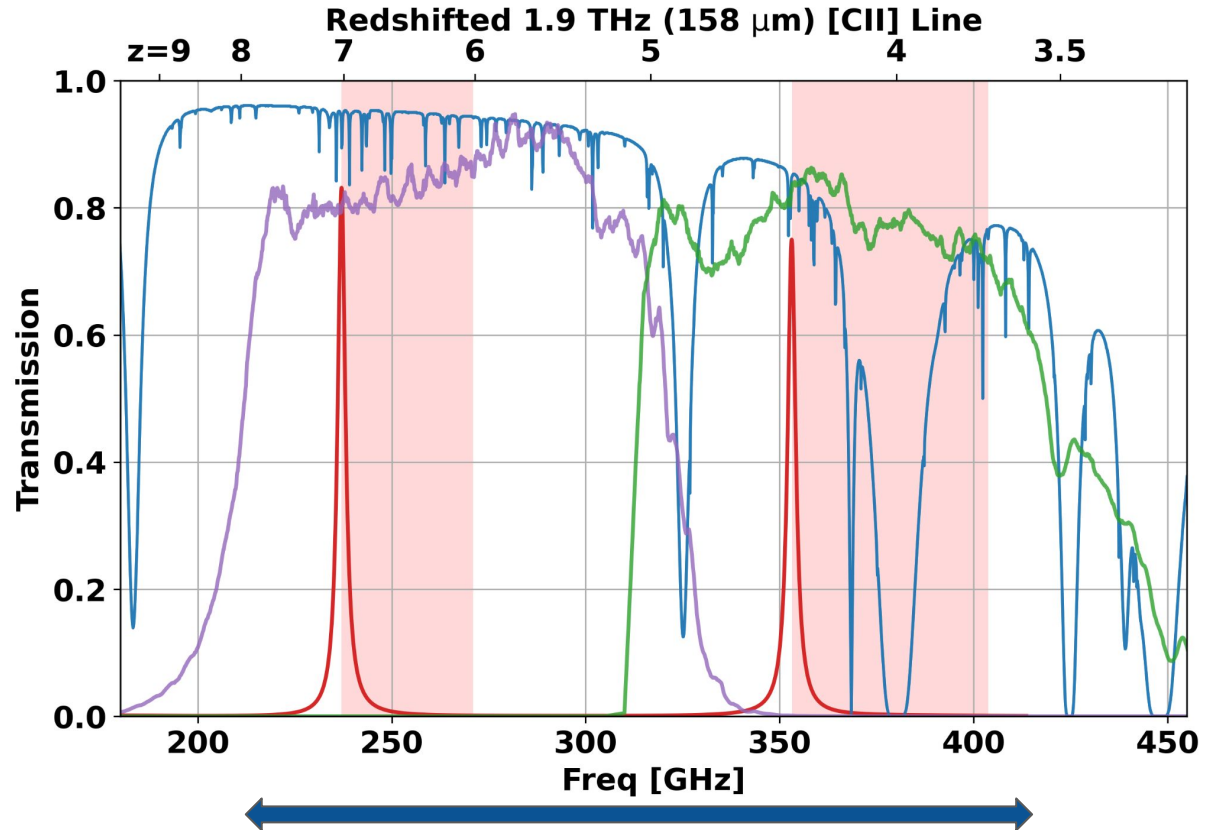
EoR-Spec Spectral Coverage

Lab testing of the instrument passbands is currently underway at Cornell University

Preliminary Lab Results

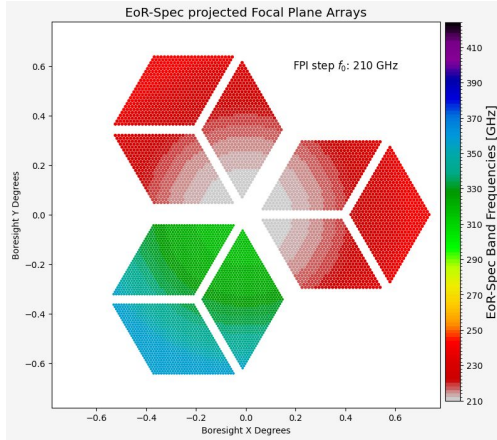
Fig: EoR-Spec Passband (feedhorn simulations and filter measurements) overlaid with atmospheric transmission for 2nd quartile weather is shown.

Credits: Thomas Nikola, Rodrigo Freundt, Yoko Okada, Gordon Stacey, EoR-Spec instrument team



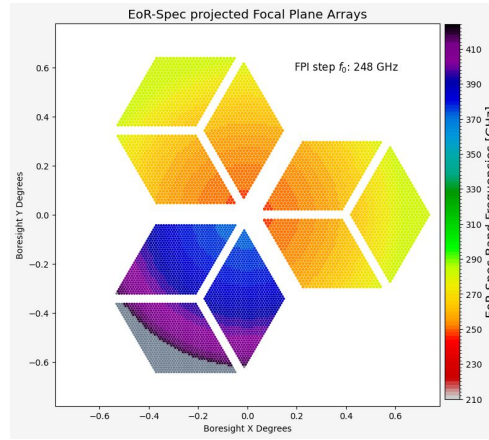
EoR-Spec Spatial and Spectral scanning

Continuous and Uniform spectral coverage achieved in 15 FPI steps



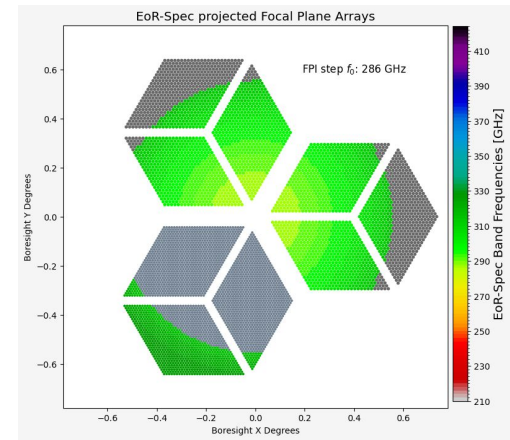
Step 1

...



Step 7

...



Step 12



15 steps: shifting the FPI resonant frequencies (f_0)

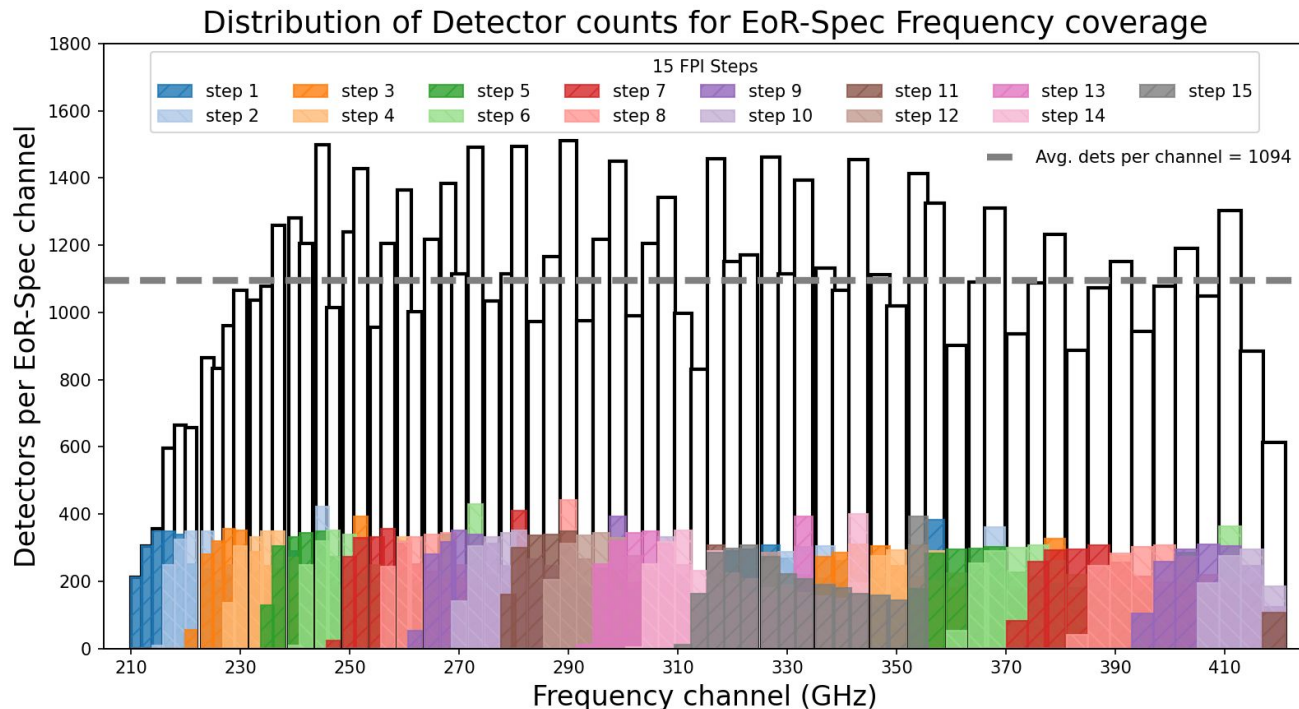
More info on: Yoko Okada's talk on Friday !

Detector distribution across Frequency bins

Spectral binning to equalize detector coverage per channel

- Each frequency bin integrates signal contributions from multiple FPI steps
- Each FPI step has a Lorentzian spectral profile with

$$\text{FWHM} = \Delta\nu = \frac{\nu}{R}$$



Impact of systematics: Atmospheric Noise

Atmosphere introduces a low frequency noise ($1/f$) component

- Atmospheric turbulence: source of brightness temperature variations, with spectral and temporal correlations
- Water vapour emission : inhomogeneously distributed
- Significant contribution at sub-mm frequencies
- Harder to recover large scale power: **Quantify signal loss**

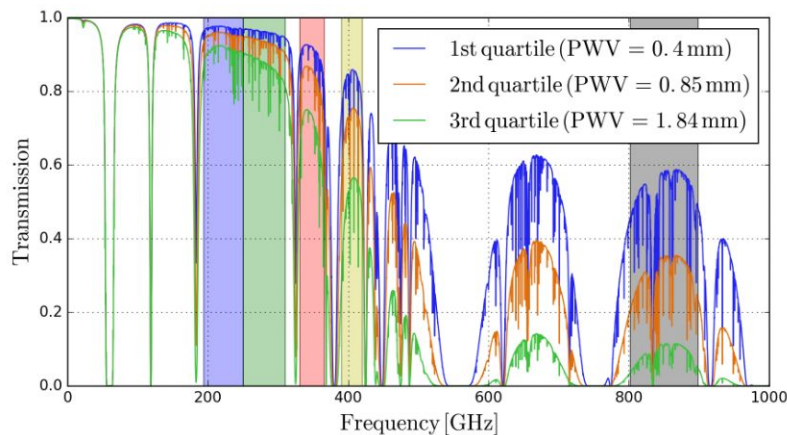


Fig: Atmospheric transmission at Cerro-Chajnantor (Choi+2020)

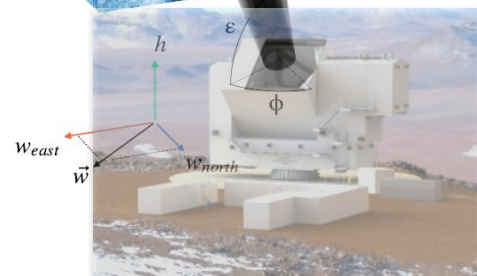
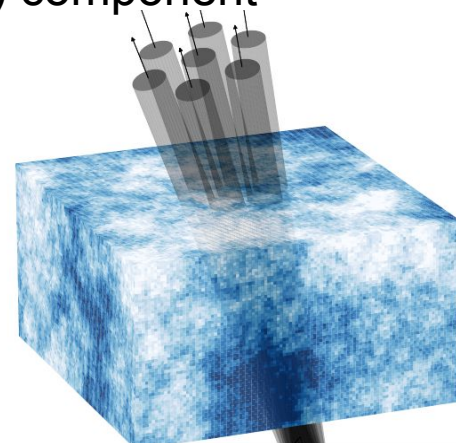
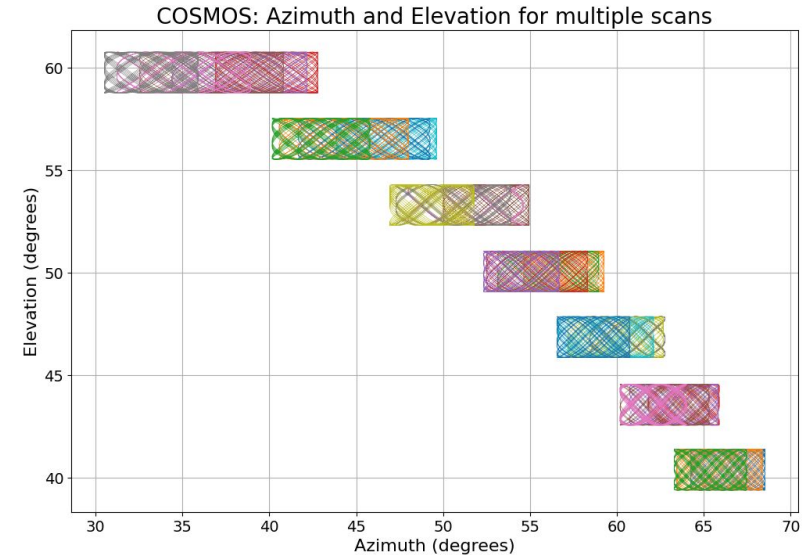
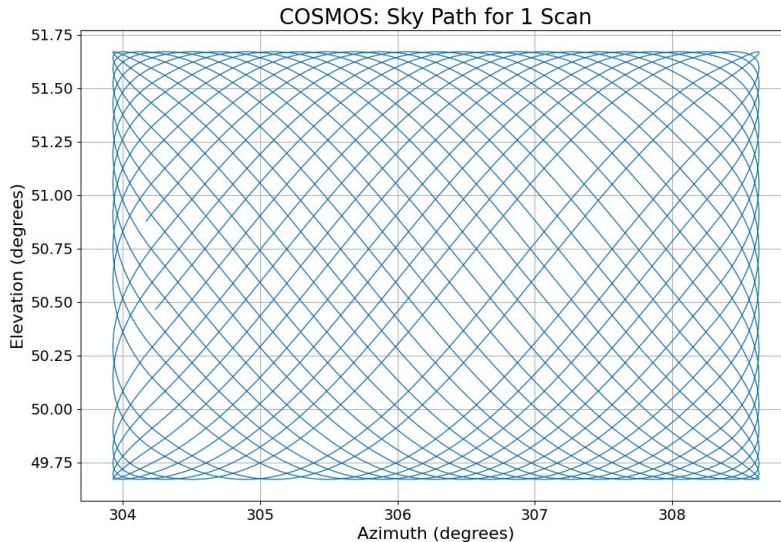


Fig: Array of detectors observing through inhomogeneous atmosphere (Morris+2022) ; Adapted with FYST model at Cerro Chajnantor (www.ccatobservatory.org)

Scanning E-COSMOS with Lissajous pattern

We simulate E-COSMOS field scans with 135 hours of integration per FPI step



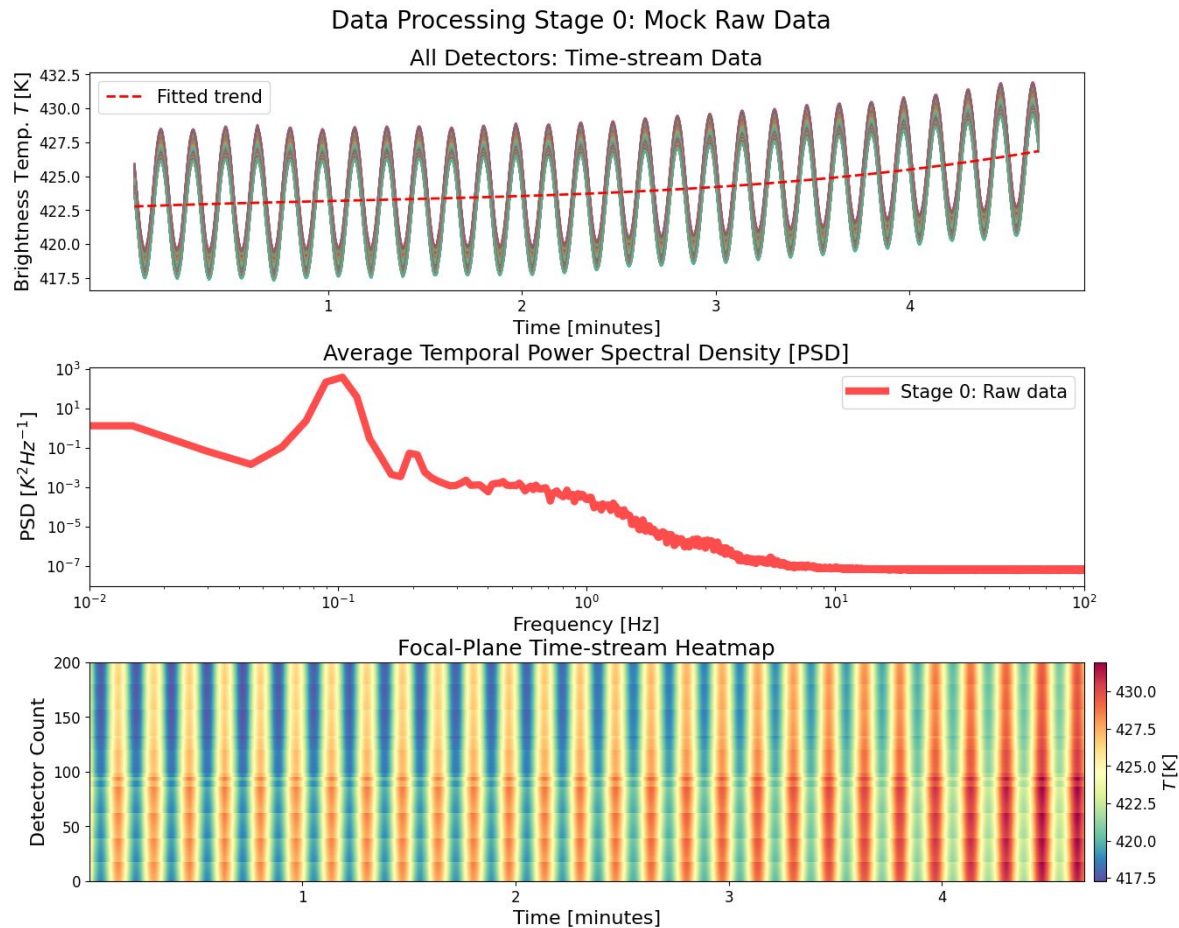
- Simulating 333 - 368 GHz spectral range, observing [CII] signal map including instrument and atmospheric 1/f noise
- Mock observation with 500 detectors per spectral bin (50% of total detectors to be deployed)

Fig: Scanning E-COSMOS field with Lissajous scans at different elevations

Data Processing Pipeline:

Raw time-stream data includes low-frequency drifts and motion-induced variations

- **Data Stage 0 : Mock Raw Data**
- Data Stage 1 : Detrended Data
- Data Stage 2 : Az-El model corrected data
- Data Stage 3 : Common Mode Removal
- Data Stage 4 : Leading components removal with PCA



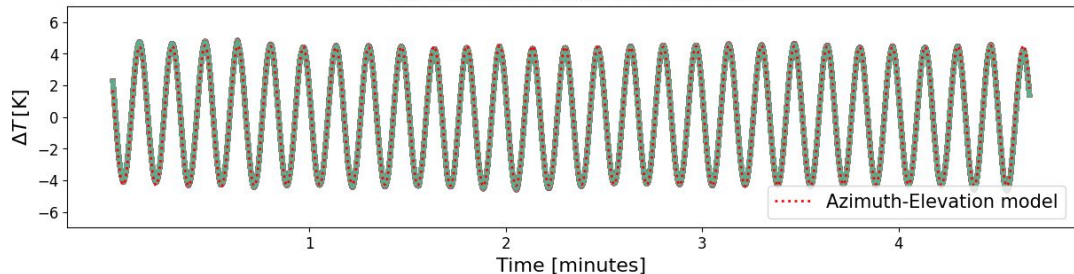
Data Processing Pipeline:

Low-order polynomial filtering removes slow drift trends from time-stream data

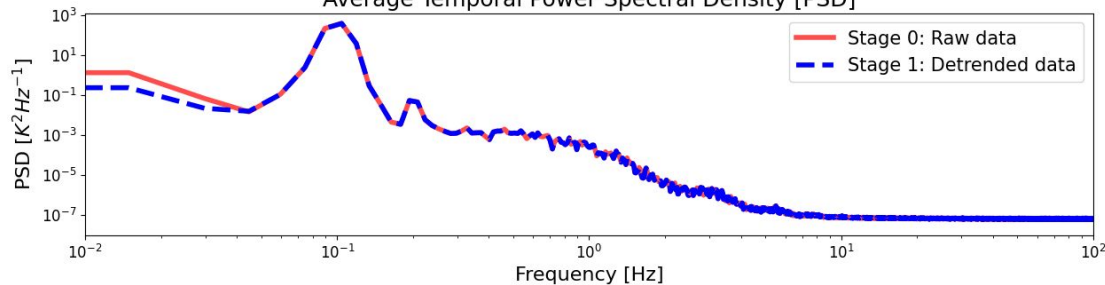
- **Data Stage 0 :**
Mock Raw Data
- **Data Stage 1 :**
Detrended Data
- **Data Stage 2 :**
Az-El model corrected data
- **Data Stage 3 :**
Common Mode Removal
- **Data Stage 4 :**
Leading components removal with PCA

Data Processing Stage 1: Detrended data

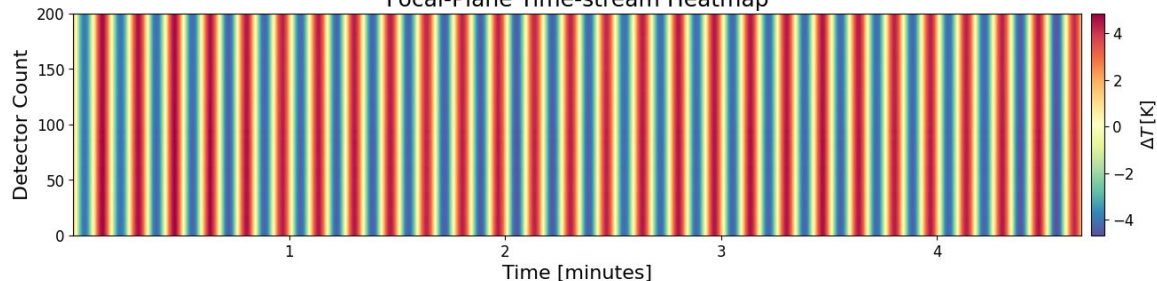
All Detectors: Time-stream Data



Average Temporal Power Spectral Density [PSD]



Focal-Plane Time-stream Heatmap

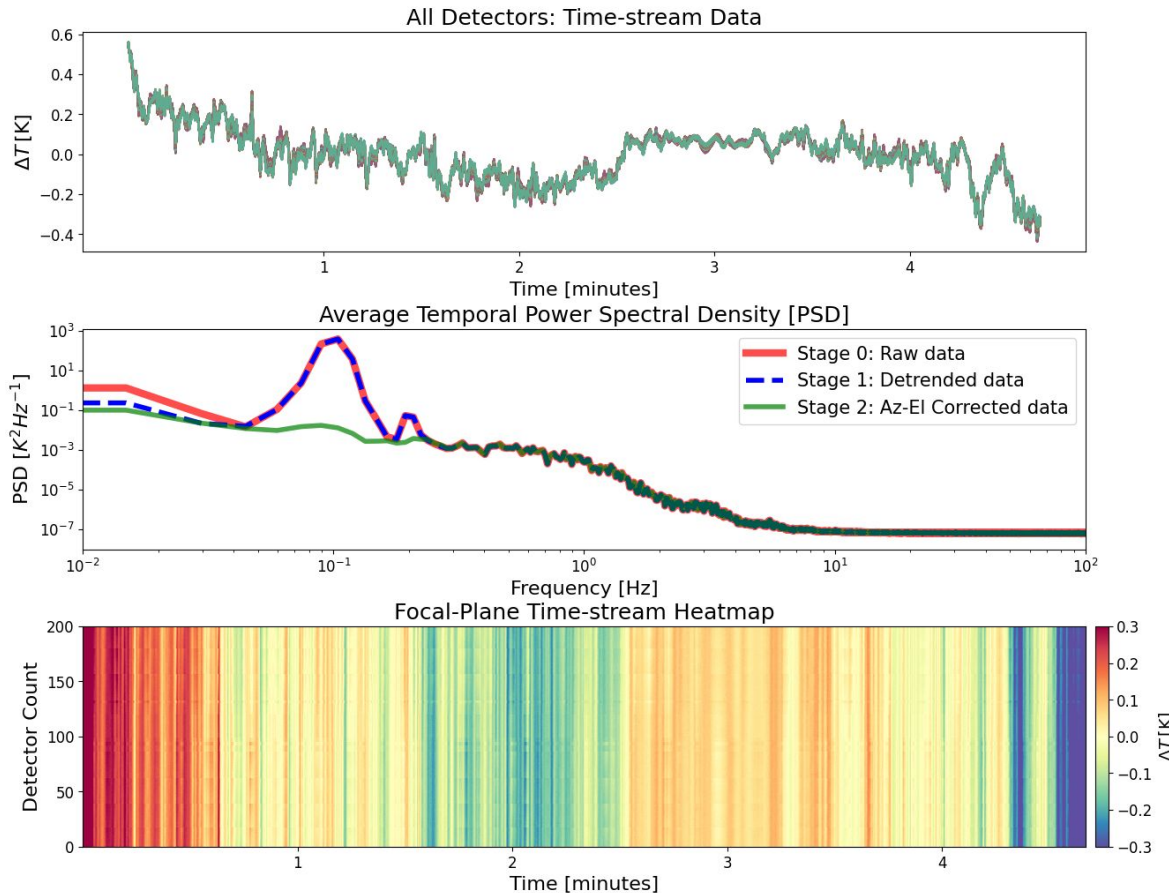


Data Processing Pipeline:

Az-El pointing template removes systematics from telescope motion and turnarounds

- **Data Stage 0 :**
Mock Raw Data
- **Data Stage 1 :**
Detrended Data
- **Data Stage 2 :**
Az-El model corrected data
- **Data Stage 3 :**
Common Mode Removal
- **Data Stage 4 :**
Leading components removal with PCA

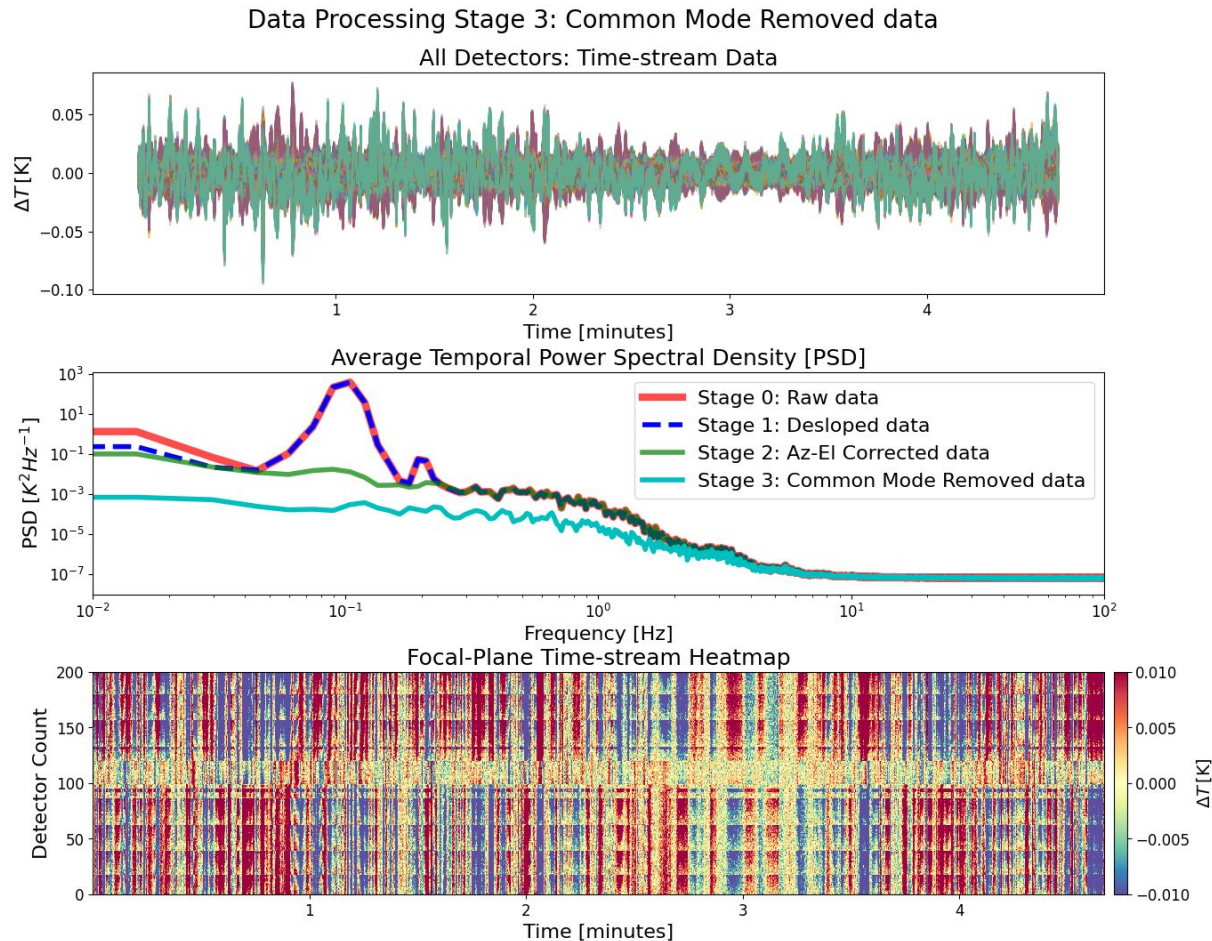
Data Processing Stage 2: Az-El Corrected data



Data Processing Pipeline:

Common Mode removes time-correlated systematics shared across the entire array

- **Data Stage 0 :**
Mock Raw Data
- **Data Stage 1 :**
Detrended Data
- **Data Stage 2 :**
Az-EI model corrected data
- **Data Stage 3 :**
Common Mode Removal
- **Data Stage 4 :**
Leading components removal with PCA

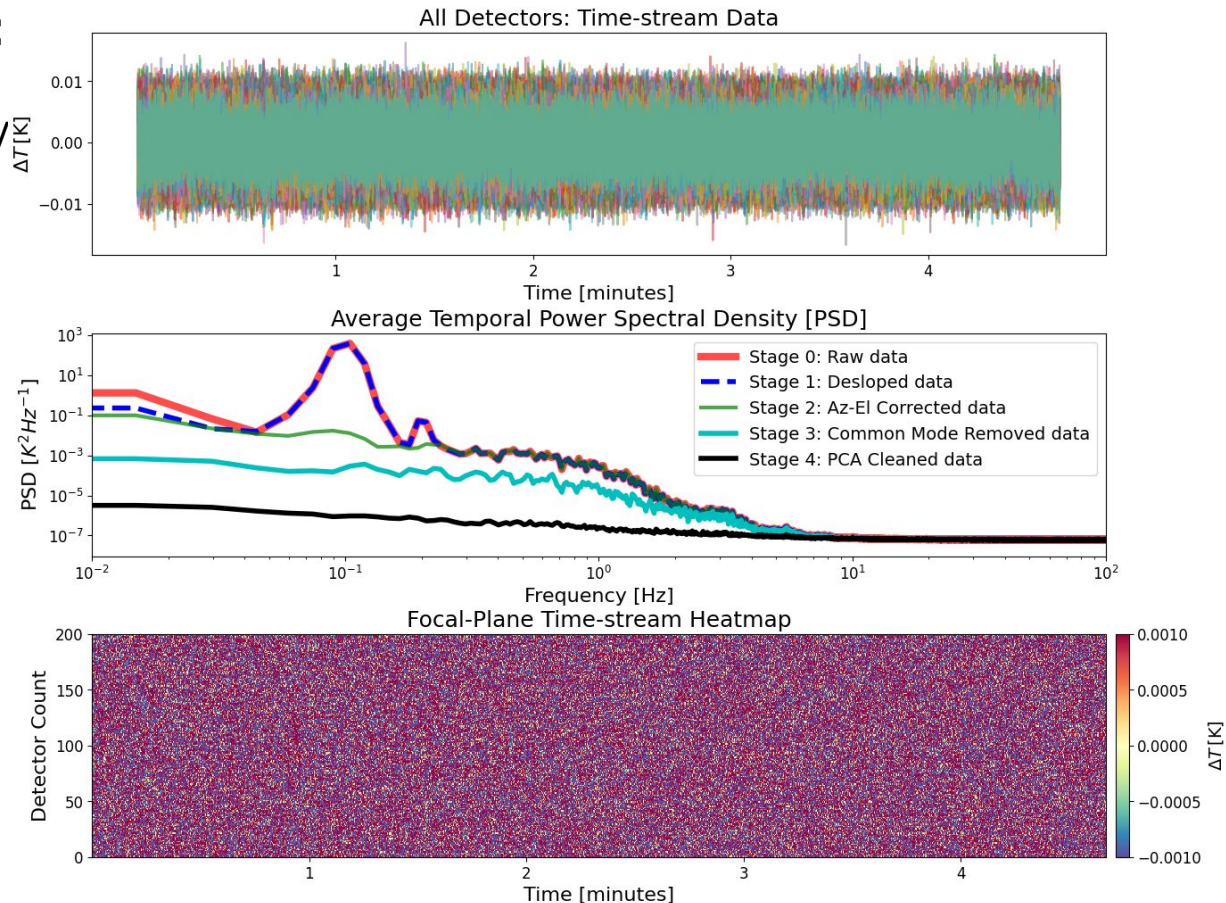


Data Processing Pipeline:

PCA removes temporally and spatially correlated low-frequency modes

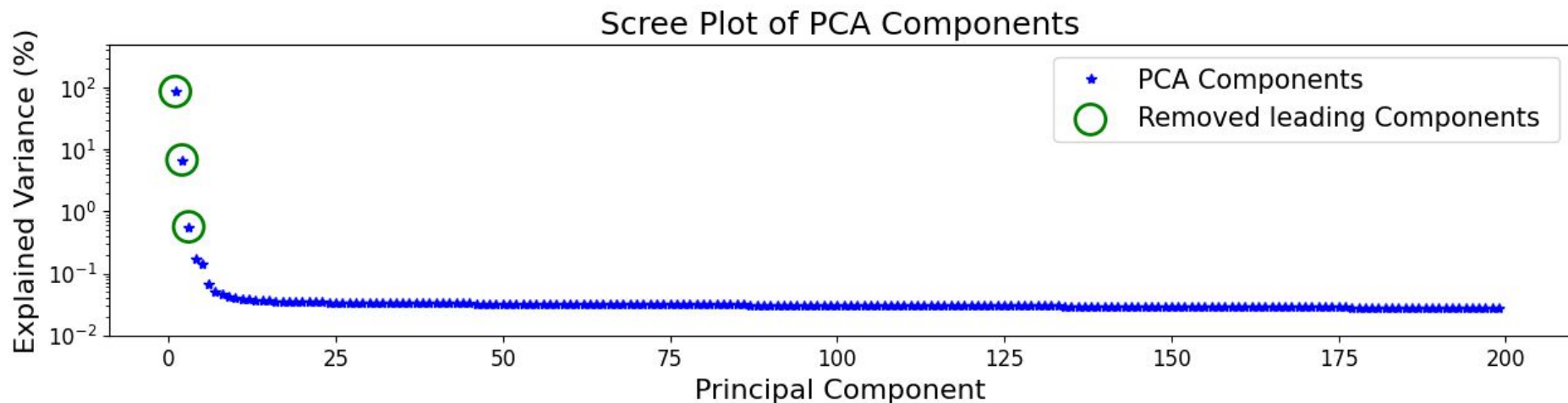
- **Data Stage 0 :**
Mock Raw Data
- **Data Stage 1 :**
Detrended Data
- **Data Stage 2 :**
Az-EI model corrected data
- **Data Stage 3 :**
Common Mode Removal
- **Data Stage 4 :**
Leading components removal with PCA

Data Processing Stage 4: PCA Cleaned data



PCA on Time-stream data: Explained Variance

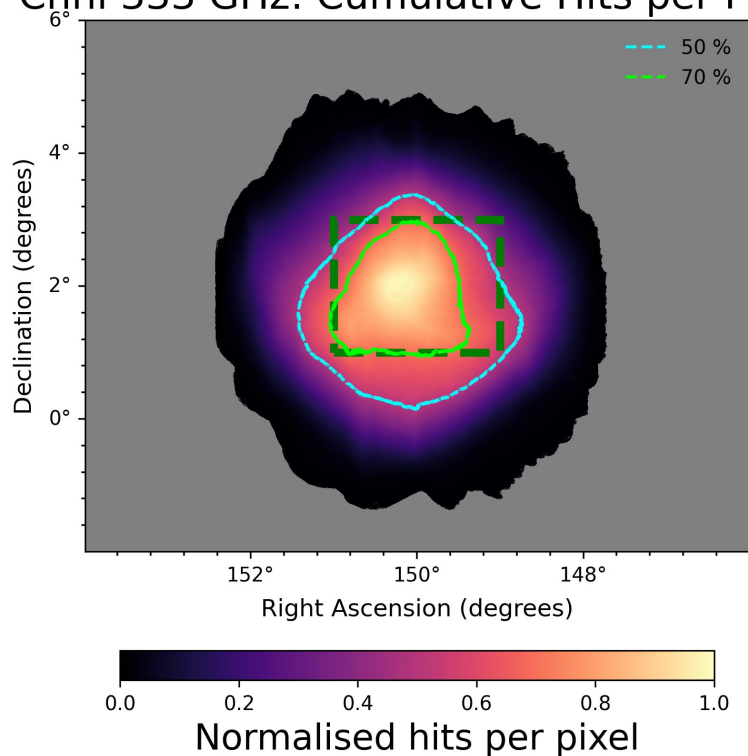
Only the most dominant components are removed to preserve astrophysical signal



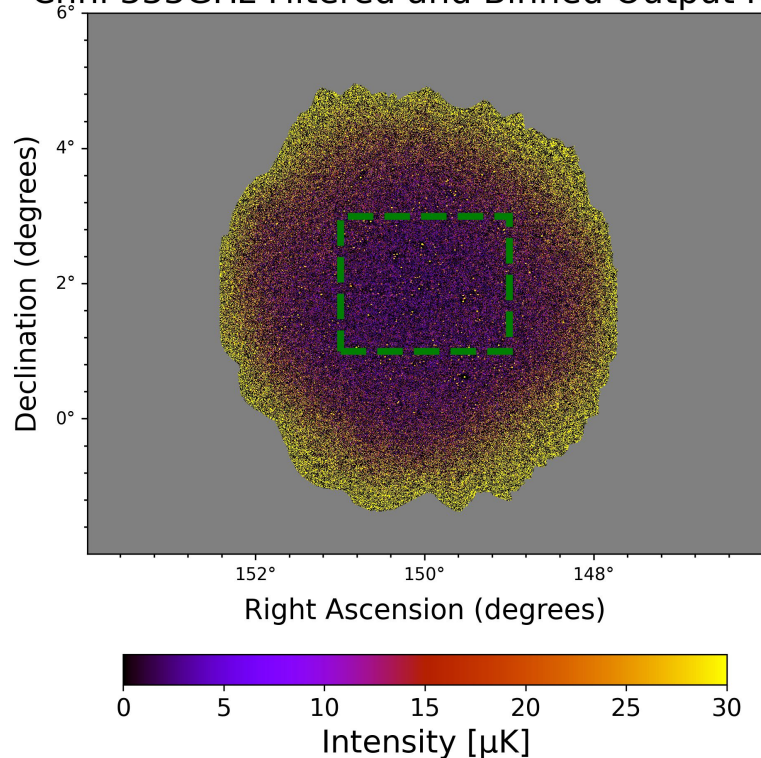
Binned Maps for E-COSMOS

Using a 4 deg² cutout from the deepest region in the field, excluding map edges

Chnl 333 GHz: Cumulative Hits per Pixel



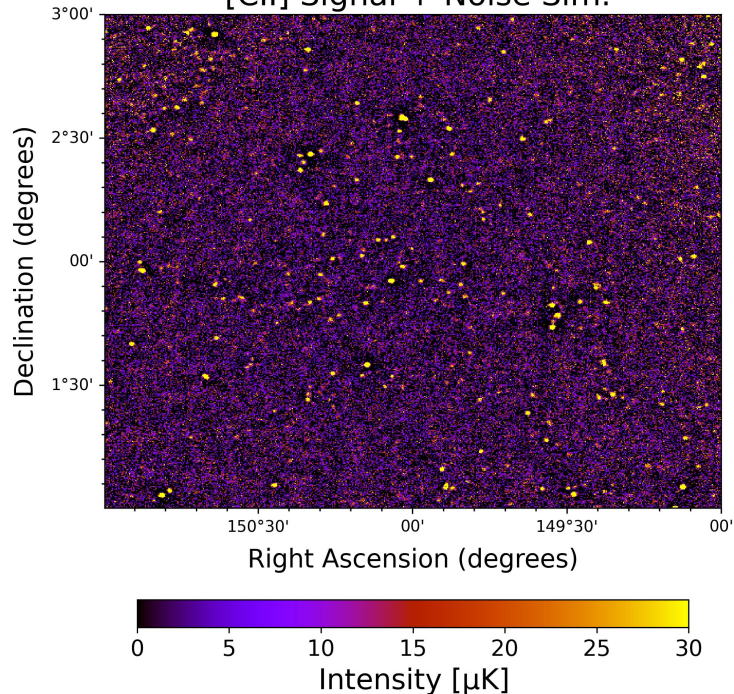
Chnl 333GHz Filtered and Binned Output Map



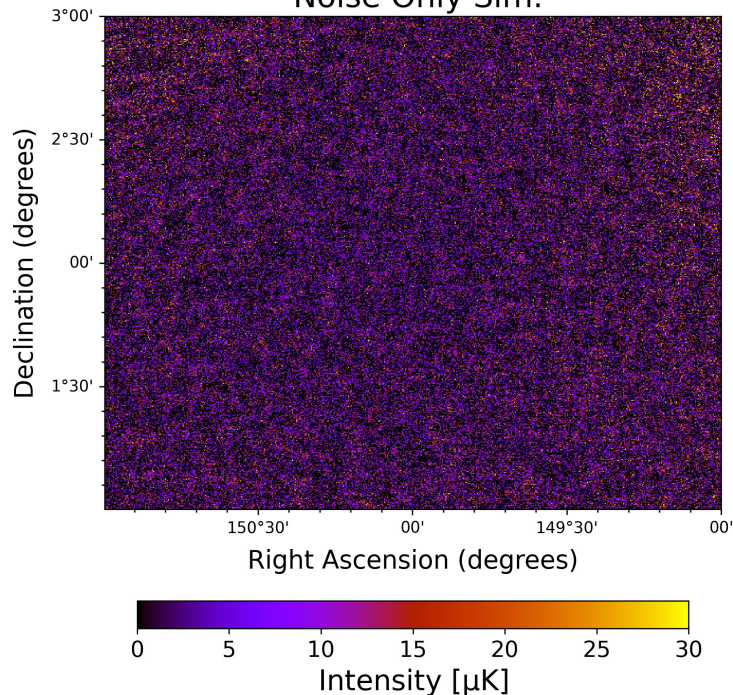
Comparison of Simulations: Signal+Noise vs. Noise-Only (No Signal)

We process Signal+Noise and Noise-only simulations through the same pipeline to quantify signal attenuation

Chnl 333GHz Filtered and Binned Output:
[CII] Signal + Noise Sim.

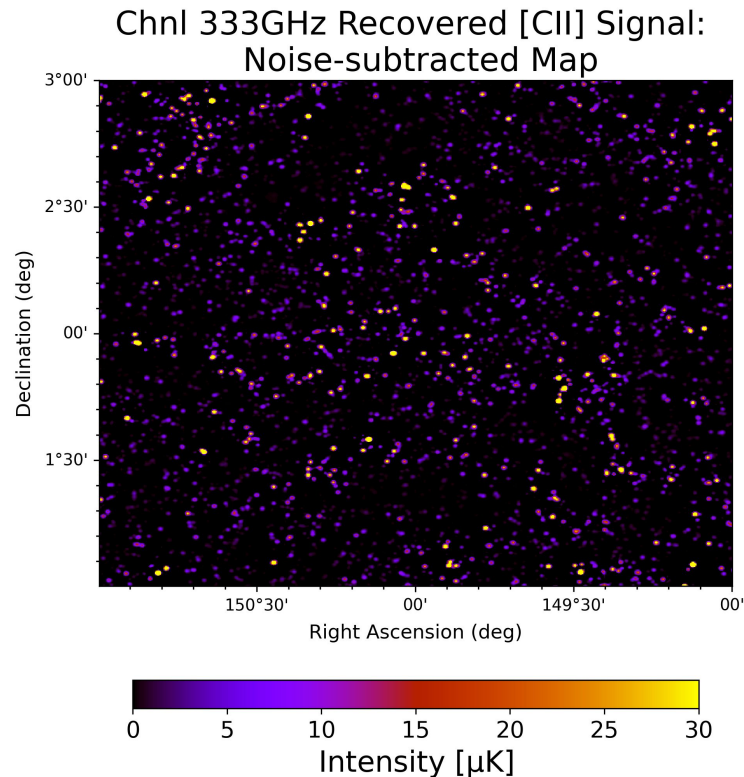
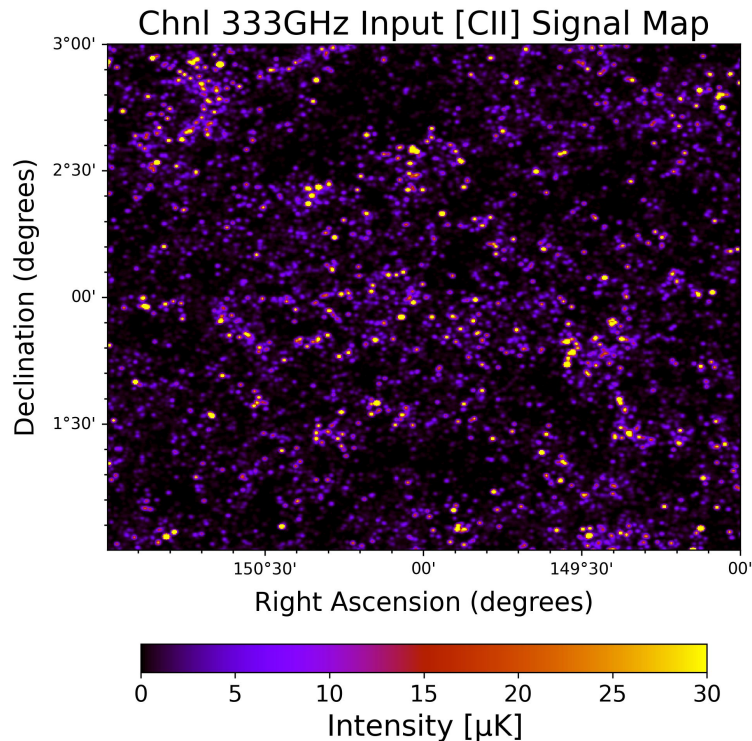


Chnl 333GHz Filtered and Binned Output:
Noise Only Sim.

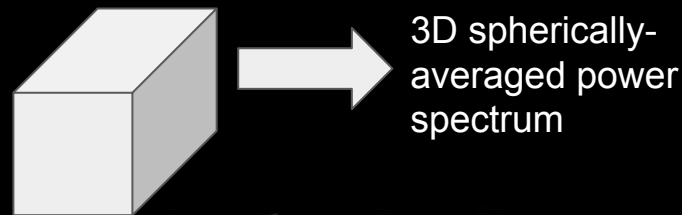


Comparison of Signal Maps: **Input Intrinsic [C II]** vs **Recovered**

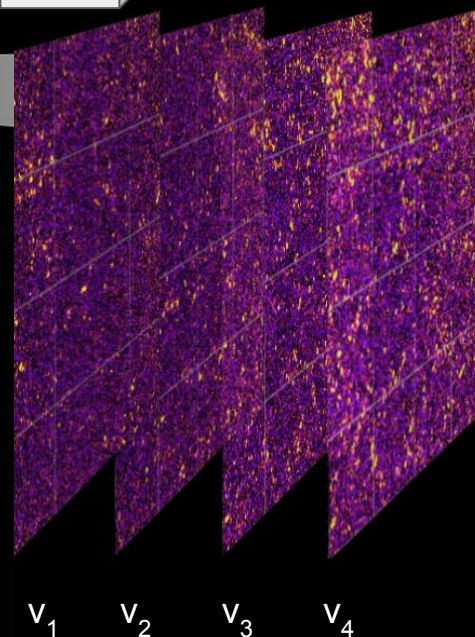
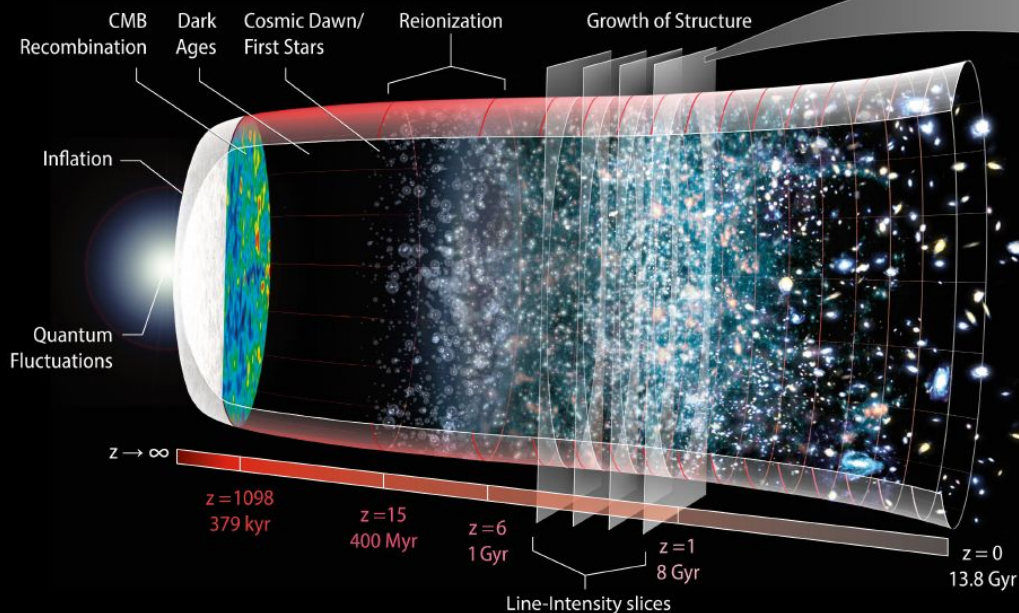
With just 50% of planned observations, bright [C II] sources are recovered (shot-noise regime), and faint clustered structures begin to emerge



Building Spectral Datacube



Line Intensity Mapping (LIM)

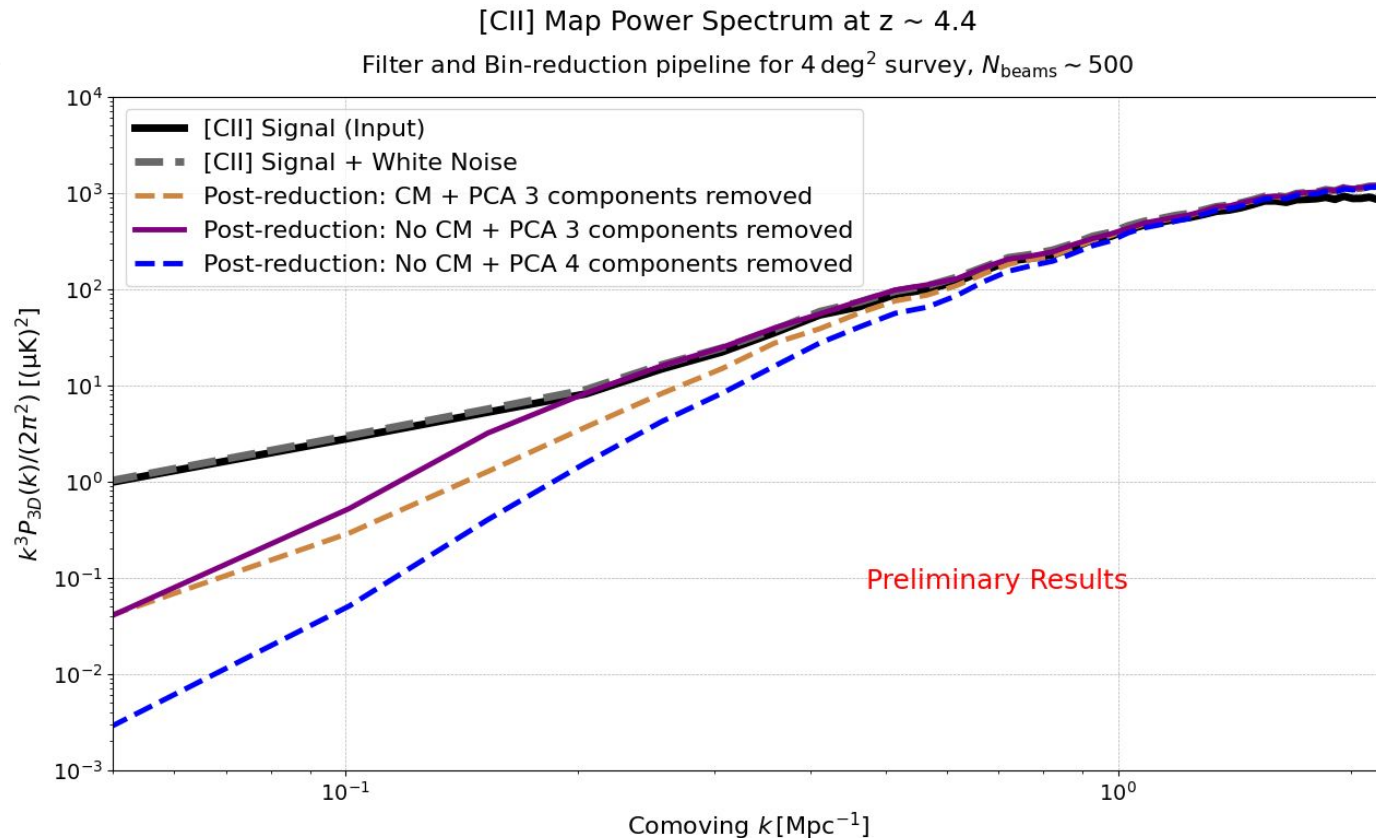


NASA LAMBDA archive

TNG based [CII] intensity simulations at $z \sim 4$ (Karoumpis+2021, Dev+in_prep)

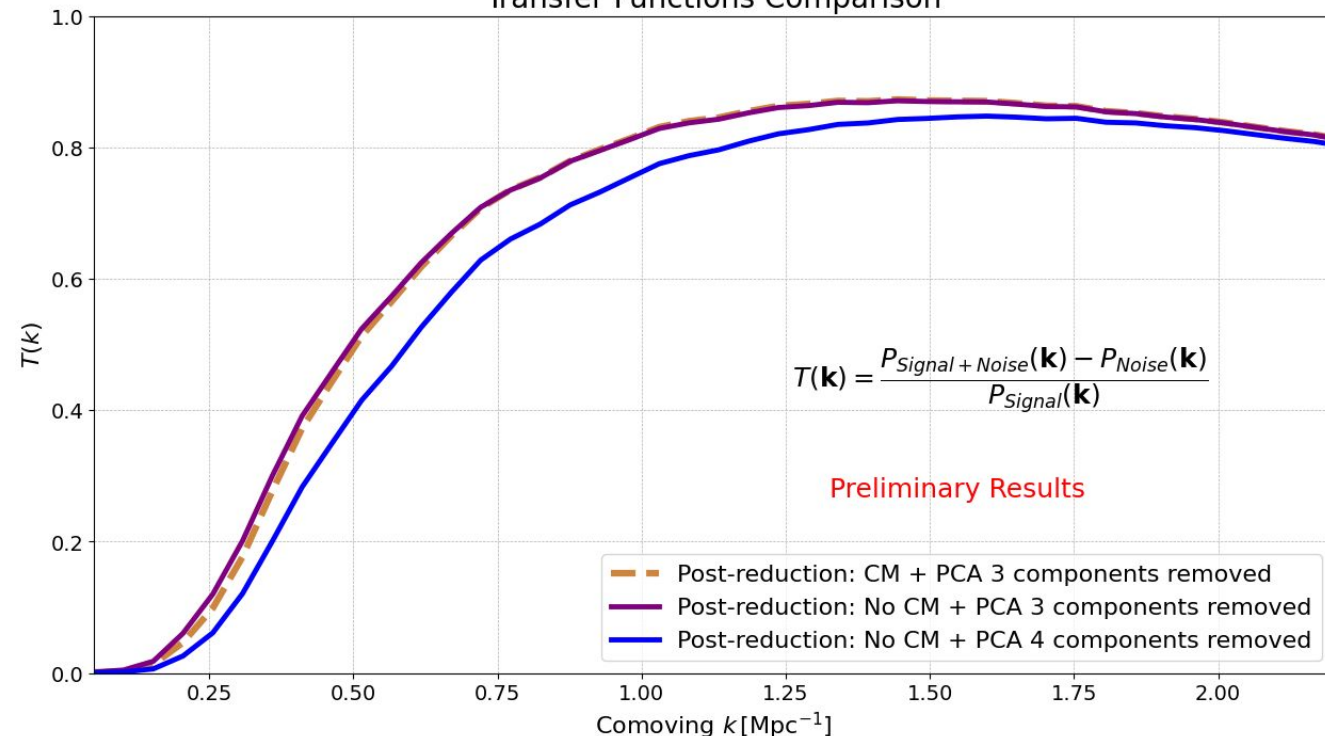
Investigating effect of filtering on [CII] Power Spectrum

- **Shot noise regime** at $z \sim 4.4$ can be detected and constrained even with 50% of planned observations
- **Low- k modes** shows power loss: Filtering affects the large scales; need alternative mitigation techniques



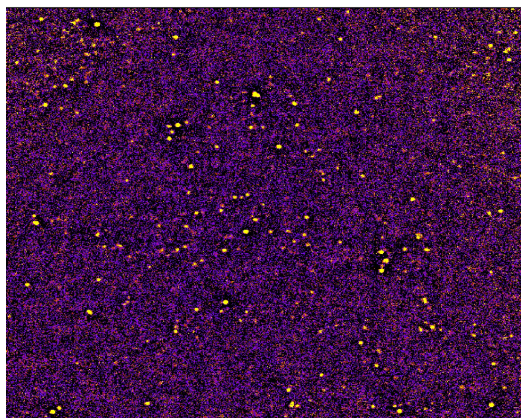
Quantifying Signal loss from mock Pipeline with Transfer Function

Transfer Functions Comparison



Require future work to recover large scales:

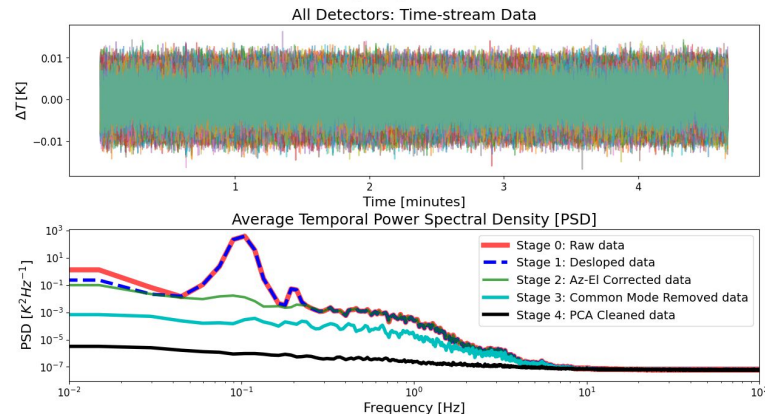
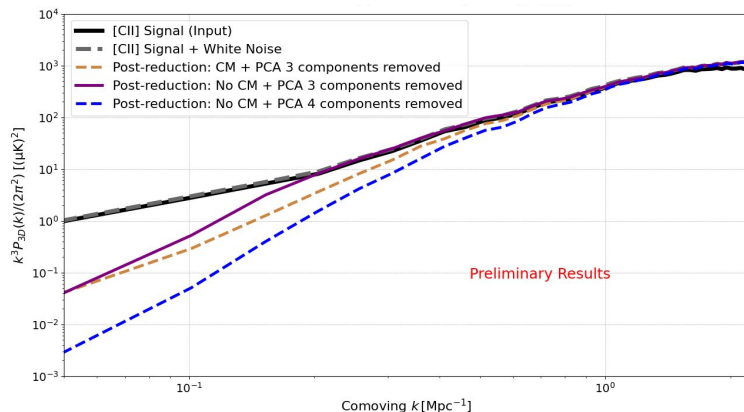
- Fourier Template fitting
- Destriping / Maximum-Likelihood
- Bayesian methods for incorporating noise priors
- Investigate higher scan speeds mitigating 1/f noise contamination



Take Away Summary



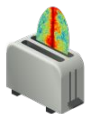
We are building LIM data reduction pipelines, investigating systematics and exploring map-making methods.



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Back-up Slides follow...

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TOAST framework and Atmospheric Model

- **Time Ordered Astrophysics Scalable Tools (TOAST)** software framework (<https://github.com/hpc4cmb/toast>)
- Built on the **Errard+2015 3D-model** of the **atmosphere total intensity emission** in the mm and sub-mm wavelengths.

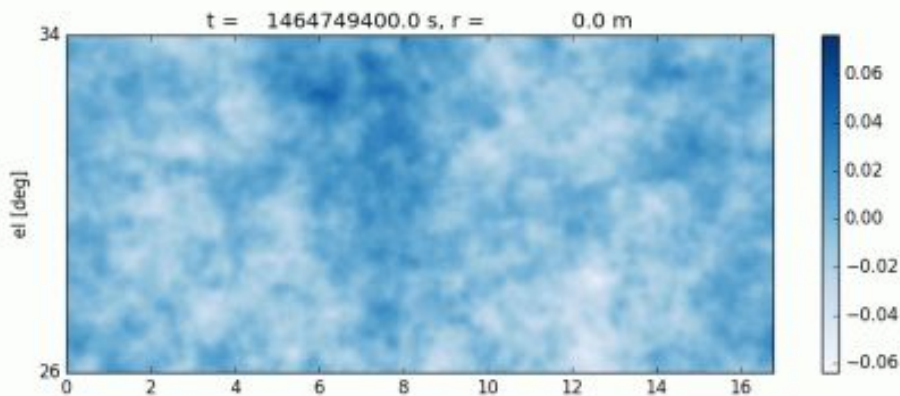


Fig left: Example of TOAST Simulated turbulent atmosphere (Image Credit: Julian Borrill, https://crd.lbl.gov/assets/Uploads/_resampled/ResizedImage400179-atm-10-30-10v1.gif)

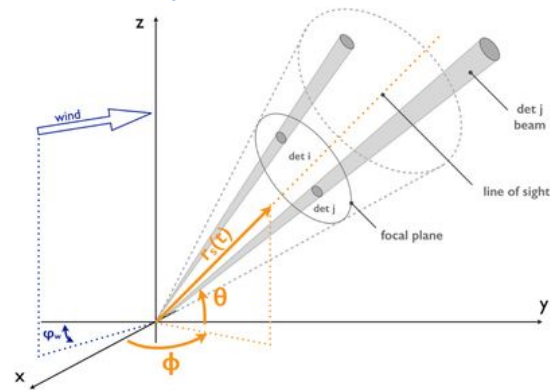
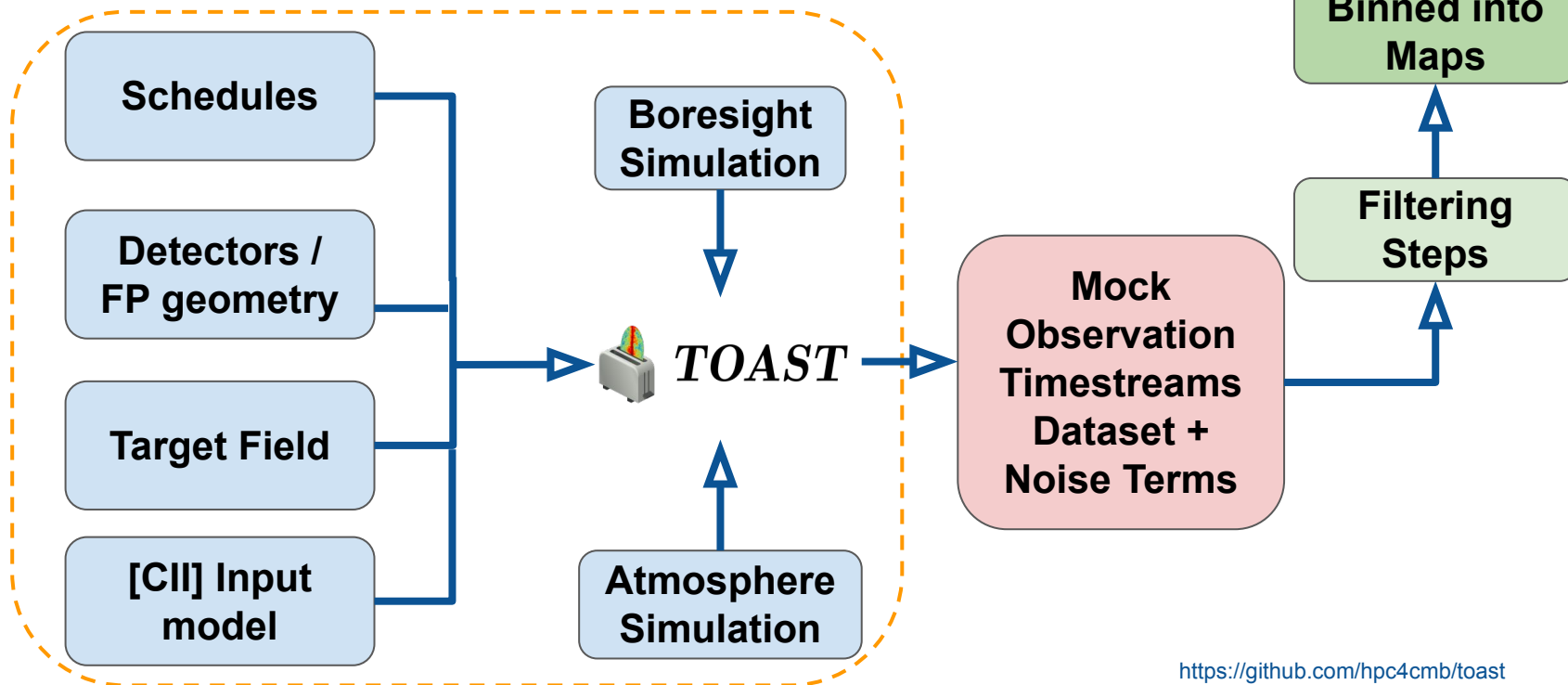


Fig right: Pair of detectors observes along a line of sight. (from Errard+2015)

Data Simulation Pipeline for Mock Observations

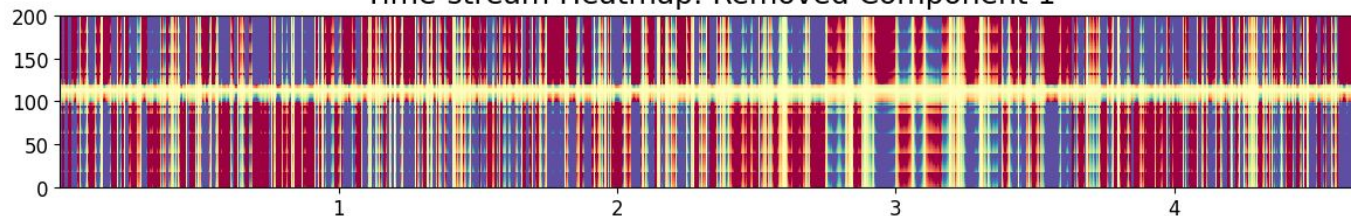


<https://github.com/hpc4cmb/toast>

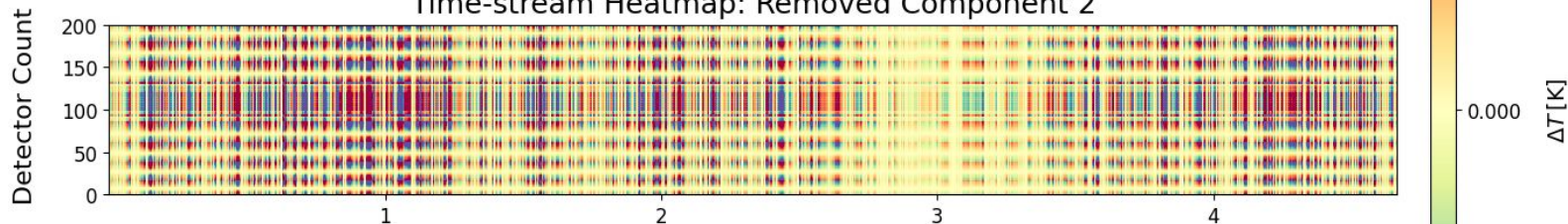
PCA on Time-stream data: Removed Components

PCA Removed Components

Time-stream Heatmap: Removed Component 1



Time-stream Heatmap: Removed Component 2



Time-stream Heatmap: Removed Component 3

