

Wide Field Radio Interferometry for Cosmology

Richard Shaw



CITA
ICAT

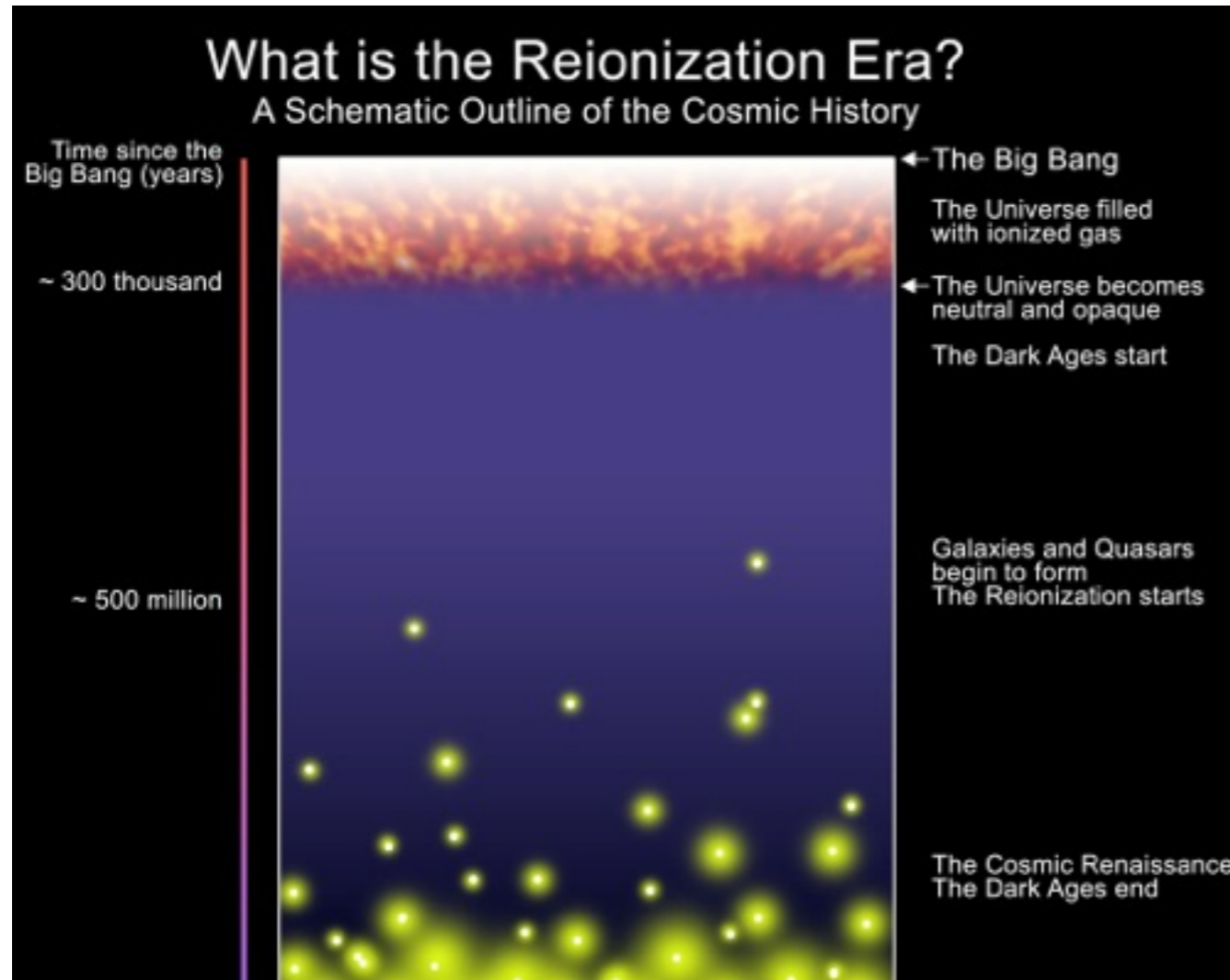
Canadian Institute for
Theoretical Astrophysics

L'institut Canadien
d'astrophysique théorique

arXiv:1302.0327

arXiv:1401.2095

History of Hydrogen



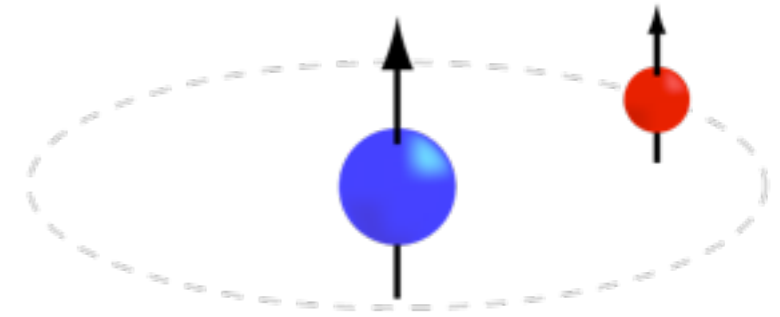
Dark ages

Reionisation



HI in galaxies

Cosmological 21cm



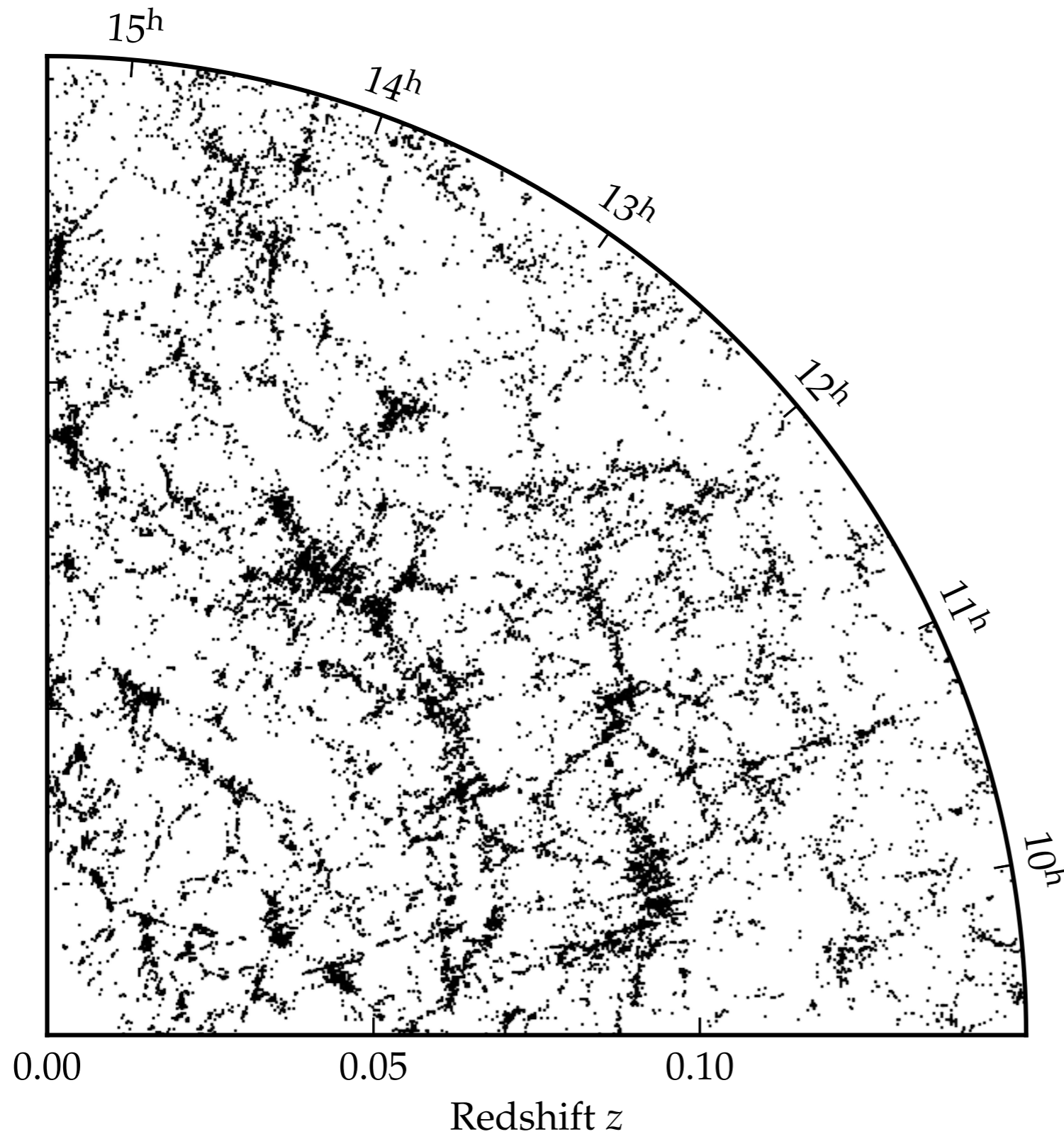
- 21cm line is the transition between parallel and anti-parallel spins in the H ground state
- The ratio between the two occupancies determines the spin temperature T_S

$$n_1/n_0 = (g_1/g_0) \exp(-T_*/T_S)$$

- We can observe the contrast relative to the CMB

$$\Delta T = 23.8 \left(\frac{1+z}{10} \right)^{1/2} [1 - \bar{x}(1 + \delta_x)] (1 + \delta_b)(1 - \delta_v) \left[\frac{T_S - T_\gamma}{T_S} \right] \text{ mK}$$

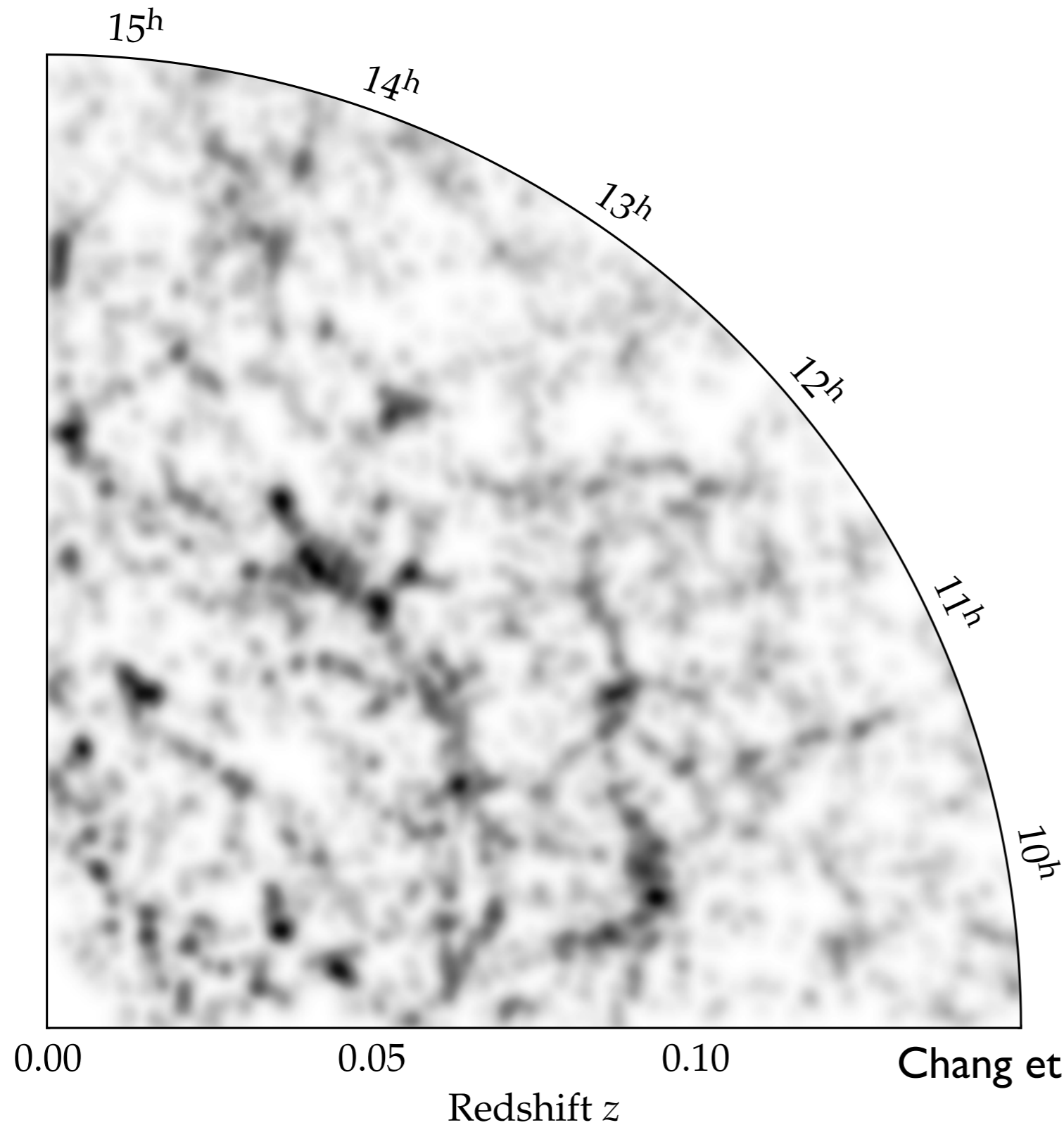
Traditional survey



- Detect all galaxies with high significance.
- Take spectra to determine redshift

Only interested
in large scales

Intensity Mapping



- Observe galaxies with a line transition
- Automatically gives redshift

Don't need to resolve individual galaxies

Chang et al, 2008; Wyithe and Loeb 2008

21cm Intensity Mapping

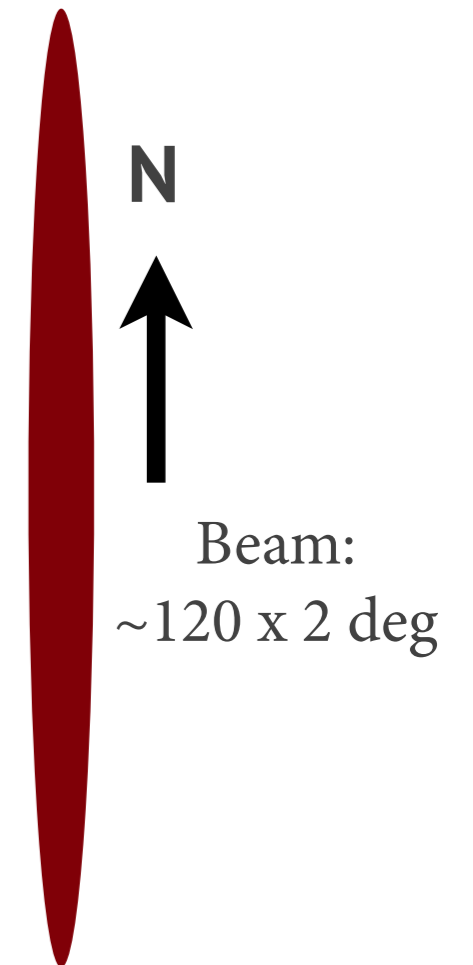
- In 21cm the frequency gives the redshift.
- Observe the diffuse emission from many unresolved galaxies
- Changes the game in telescope design:
 - ▶ Previously: large field of view, large collecting area, large angular resolution (SKA?)
 - ▶ Now: large field of view, large collecting area, modest angular resolution (compact arrays, single dishes).

Traditional Interferometer



Small field of view
High resolution imaging

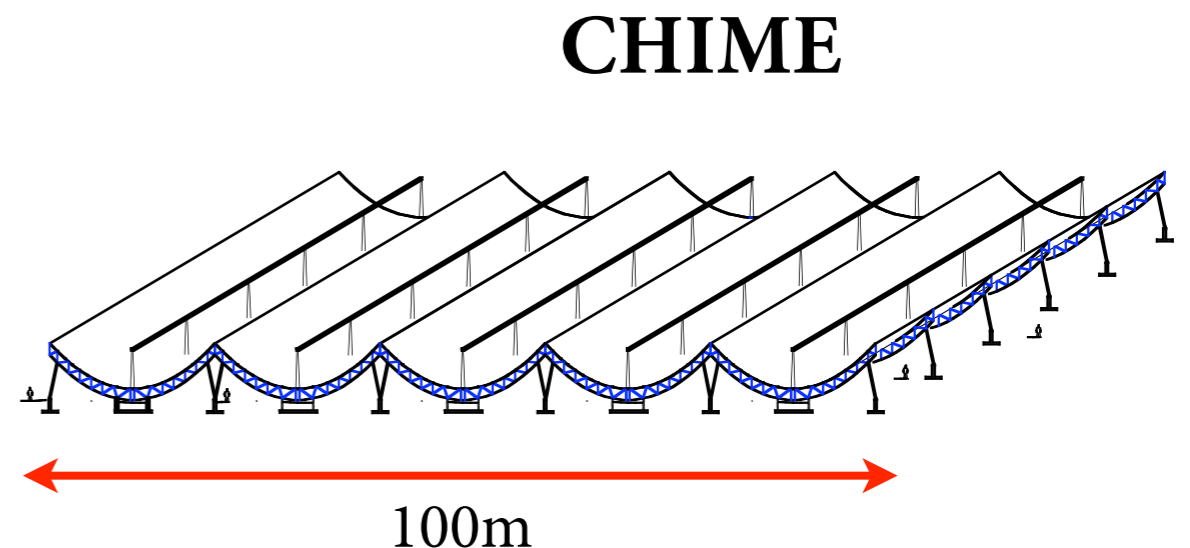
Survey Interferometers



Large field of view
Low resolution surveys

21cm Drift Scan Interferometers

- Transit instrument, no moving parts, time variation comes only from Earth rotation, plus noise.
- Most experiments have large challenges:
 - ▶ Wide field at given instant (*$\sim 180 \times 1$ degrees*)
 - ▶ All sky as total surveyed area is large (*3π sr*)
 - ▶ Data volume (*many TB/day*)
 - ▶ Polarisation leakage
 - ▶ Foreground removal



Interferometers

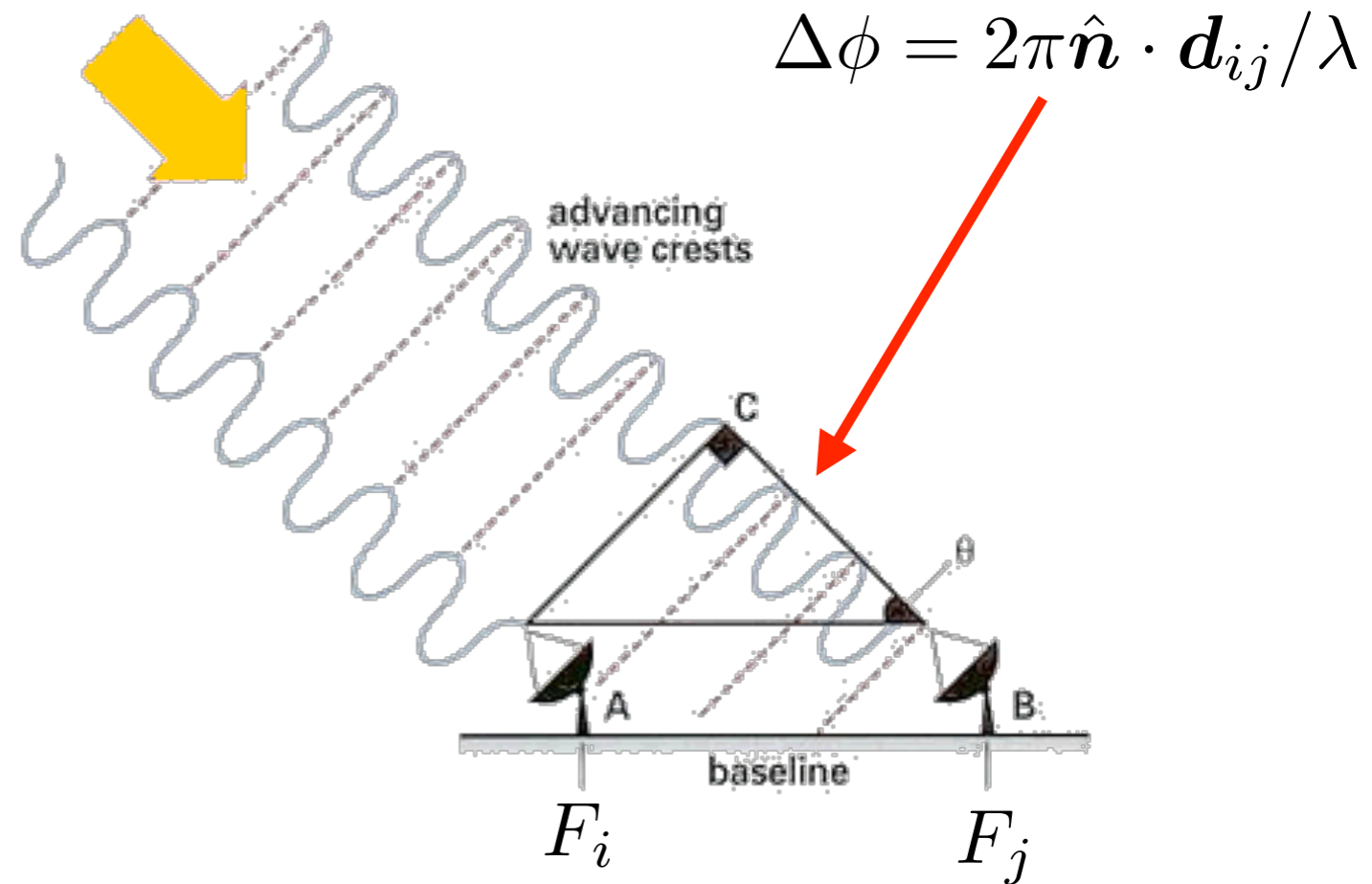
- Visibility is instantaneous correlation of 2 antennas

$$V_{ij} = \langle F_i F_j^* \rangle$$

- Written explicitly:

$$V_{ij}(t) = \frac{1}{\Omega_{ij}} \int d^2 \hat{\mathbf{n}} A_i(\hat{\mathbf{n}}; t) A_j^*(\hat{\mathbf{n}}; t) e^{2\pi i \hat{\mathbf{n}} \cdot \mathbf{u}_{ij}(t)} T(\hat{\mathbf{n}})$$

- Traditional analysis approximates this to a 2D Fourier transform and proceeds from there.

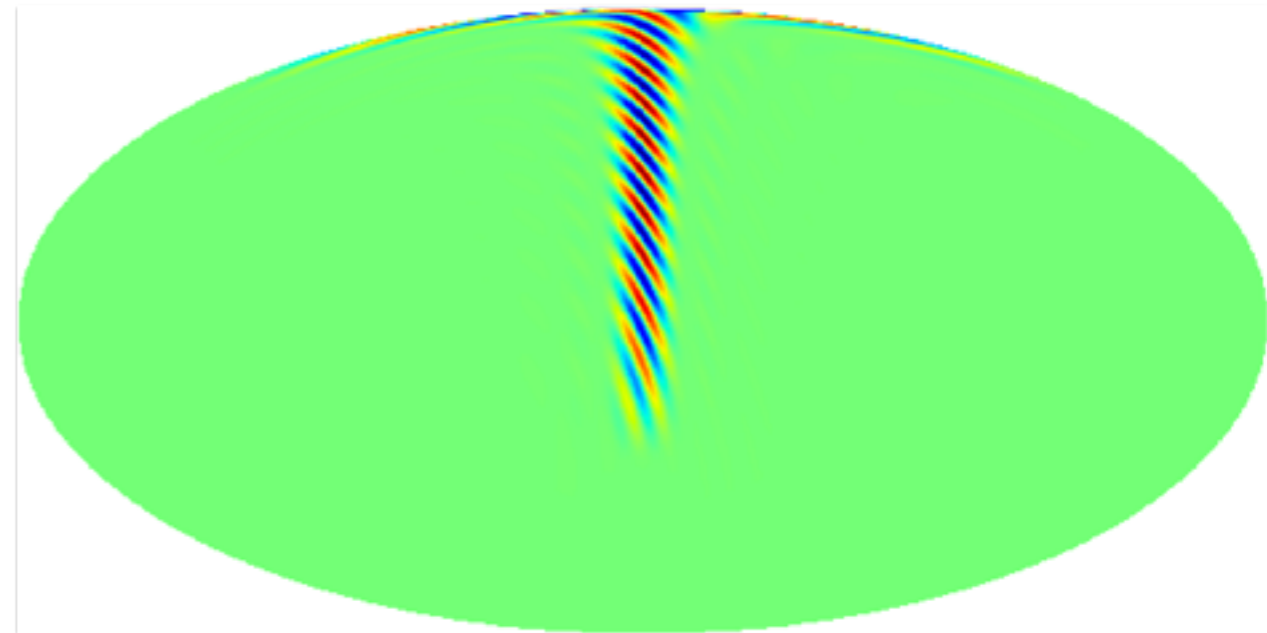


Interferometers

- Write in terms of a beam transfer function:

$$V_{ij}(t) = \frac{1}{\Omega_{ij}} \int d^2 \hat{\mathbf{n}} A_i(\hat{\mathbf{n}}; t) A_j^*(\hat{\mathbf{n}}; t) e^{2\pi i \hat{\mathbf{n}} \cdot \mathbf{u}_{ij}(t)} T(\hat{\mathbf{n}})$$

$$V_{ij}(t) = \int d^2 \hat{\mathbf{n}} B_{ij}(\hat{\mathbf{n}}; t) T(\hat{\mathbf{n}}) + n_{ij}(t)$$



Transit Interferometers

- Timeseries is periodic on the sidereal day $t \rightarrow \phi$
 - ▶ Apply this restriction and see how the analysis goes.

$$V_{ij}(\phi) = \int d^2 \hat{\mathbf{n}} B_{ij}(\hat{\mathbf{n}}; \phi) T(\hat{\mathbf{n}}) + n_{ij}(\phi)$$

**Spherical
Harmonic
Transform**

$$V^{ij}(\phi) = \sum_{lm} B_{lm}^{ij}(\phi) a_{lm}^T + n^{ij}(\phi)$$

Fourier Transform

$$V_m^{ij} = \sum_l B_{lm}^{ij} a_{lm}^T + n_m^{ij}$$

m-mode transform

- Mapping does not mix m's (each is independent)

$$V_m^\alpha = \sum_l B_{lm}^\alpha a_{lm}^T + n_m^\alpha$$

- Write in vector form

$$\mathbf{v} = \mathbf{B} \mathbf{a} + \mathbf{n} .$$

- Simple, linear mapping from the information on the sky, to the measured degrees of freedom
- Discrete relation, with finite number of degrees, can apply all the standard statistical, signal processing techniques to it.
- Computationally efficient: For 1000 m's an $O(N^3)$ matrix operation becomes 10^6 times faster

Polarisation

- Extends easily to polarisation. Measurement equation:

$$V_{ij}(\phi) = \int \left[B_{ij}^T(\hat{\mathbf{n}}; \phi) T(\hat{\mathbf{n}}) + B_{ij}^Q(\hat{\mathbf{n}}; \phi) Q(\hat{\mathbf{n}}) + B_{ij}^U(\hat{\mathbf{n}}; \phi) U(\hat{\mathbf{n}}) \right] d^2 \hat{\mathbf{n}} + n_{ij}(\phi)$$

- Transfer function:

$$B_{ij}^X(\hat{\mathbf{n}}; \phi) = \frac{1}{\Omega_{ij}} A_i^a(\hat{\mathbf{n}}; \phi) A_j^{b*}(\hat{\mathbf{n}}; \phi) \mathcal{P}_{ab}^X(\hat{\mathbf{n}}) e^{2\pi i \hat{\mathbf{n}} \cdot \mathbf{u}_\alpha(\phi)}$$

- m-mode map:

$$V_{ij;m} = \sum_l \left[B_{ij;lm}^T a_{lm}^T + B_{ij;lm}^E a_{lm}^E + B_{ij;lm}^B a_{lm}^B \right] + n_{ij;m}$$

Interferometric Imaging

- Traditional imaging is based around the 2D Fourier Transform approximation to the measurement equation (only valid on small patches instantaneously)
- Use a series of steps to relax this approximation and increase field of view (w-projection, mosaicking, A-projection)
 - ▶ eg. w-term. From non coplanarity of array and sky. Solve by iteratively deconvolving the effects

$$V = \int dx dy A^2(x, y) e^{2\pi i (ux + vy + w \sqrt{1-x^2-y^2})} I(x, y)$$

m-mode Imaging

- For our restricted domain (transit telescopes), we can solve the problem exactly.

- Measurement is linear mapping:

$$\mathbf{v} = \mathbf{B} \mathbf{a} + \mathbf{n} .$$

- How do we make an image of the sky? Use standard tools of signal processing:

- ▶ Pseudo-inverse to solve and regularize (*maximum likelihood*)

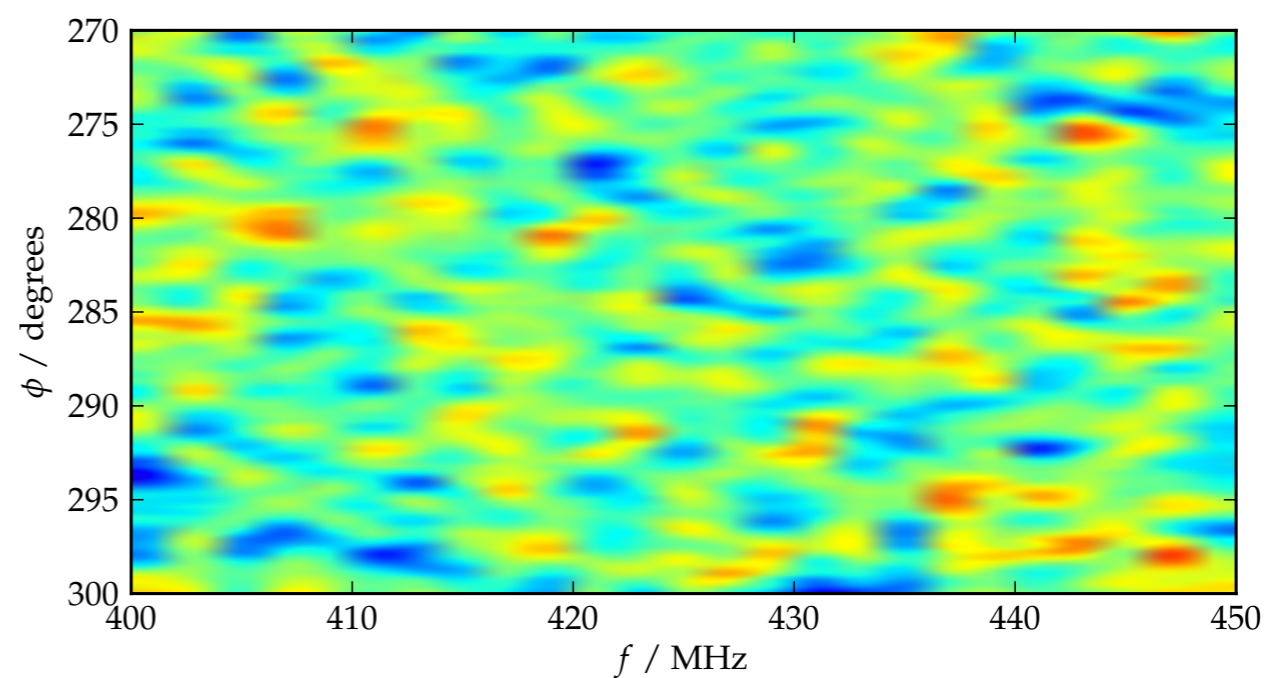
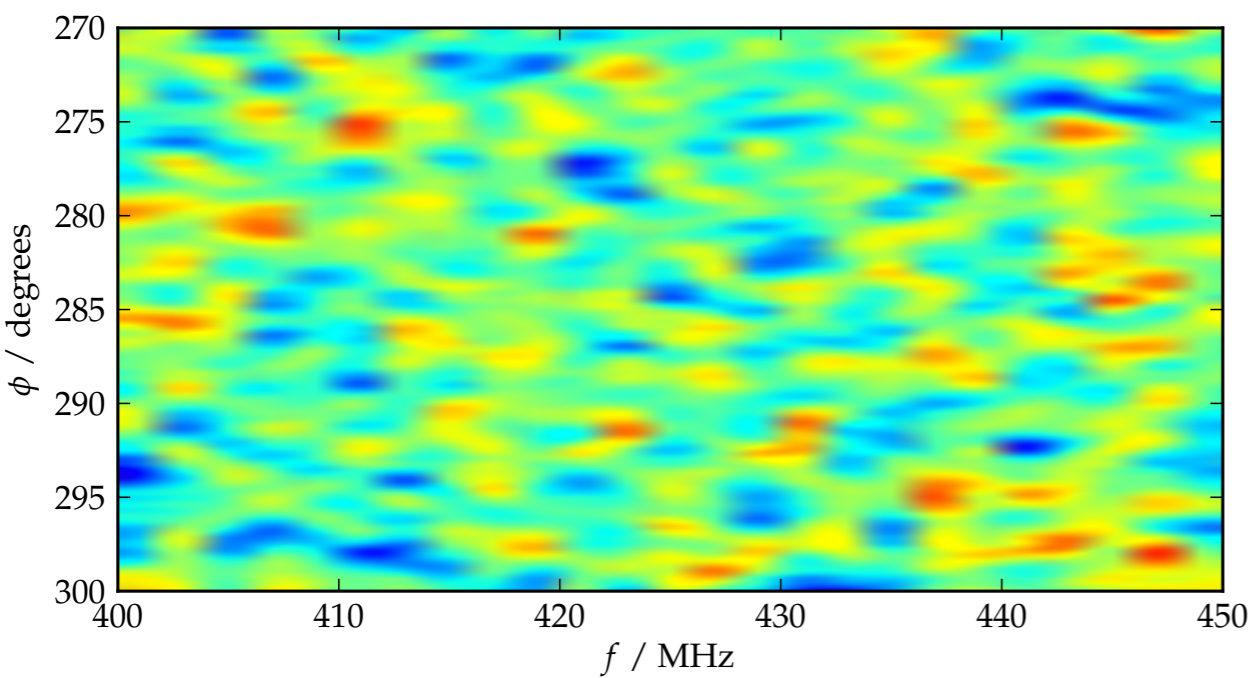
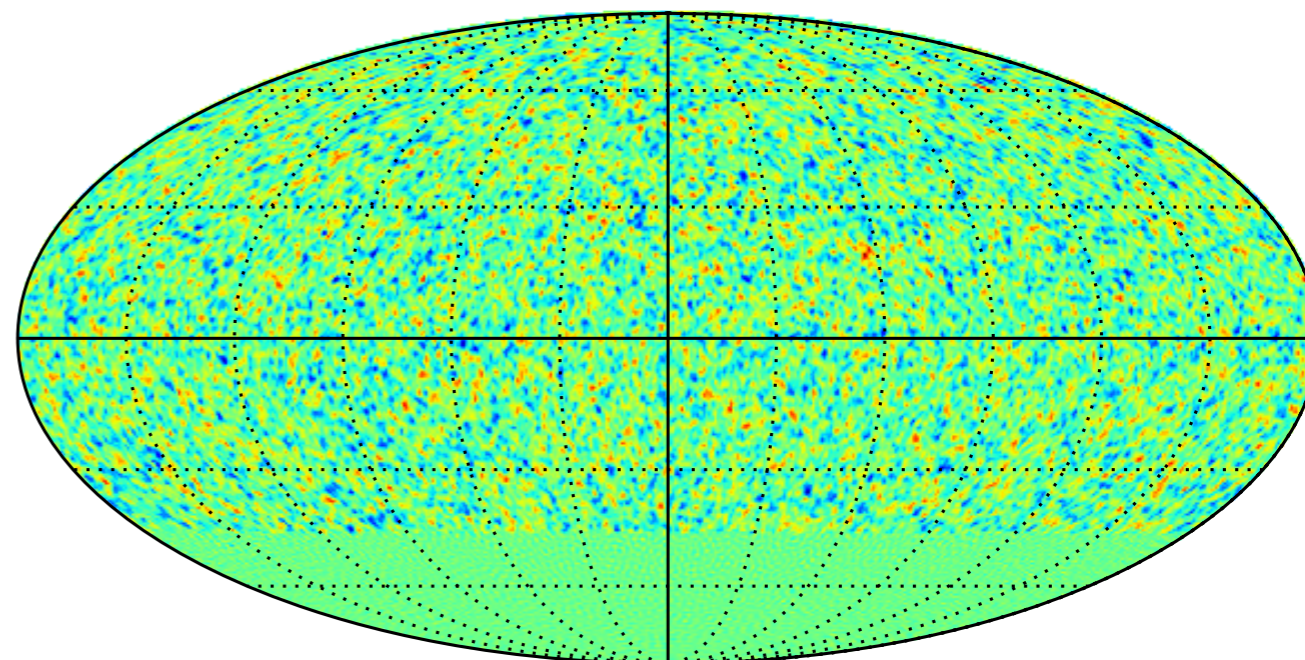
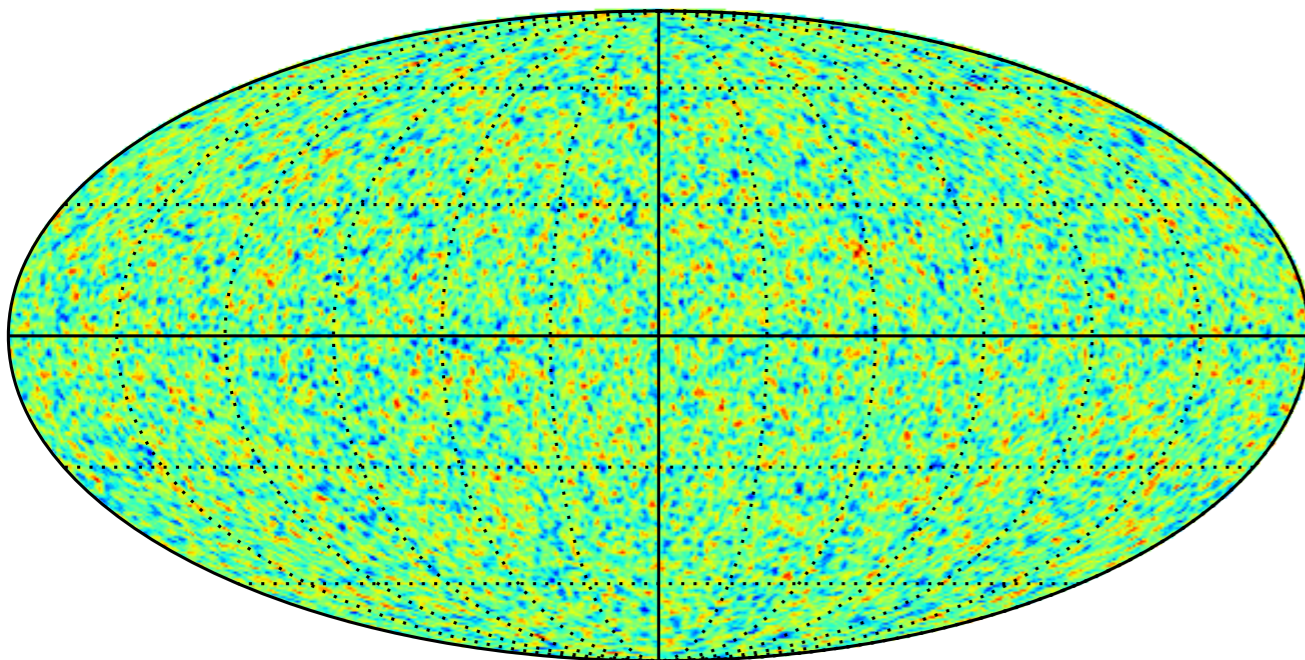
- ▶ Wiener Filter (*Bayesian expectation*)

- Conceptually straightforward. Deals naturally with all full sky effects, polarisation etc.

Simulated

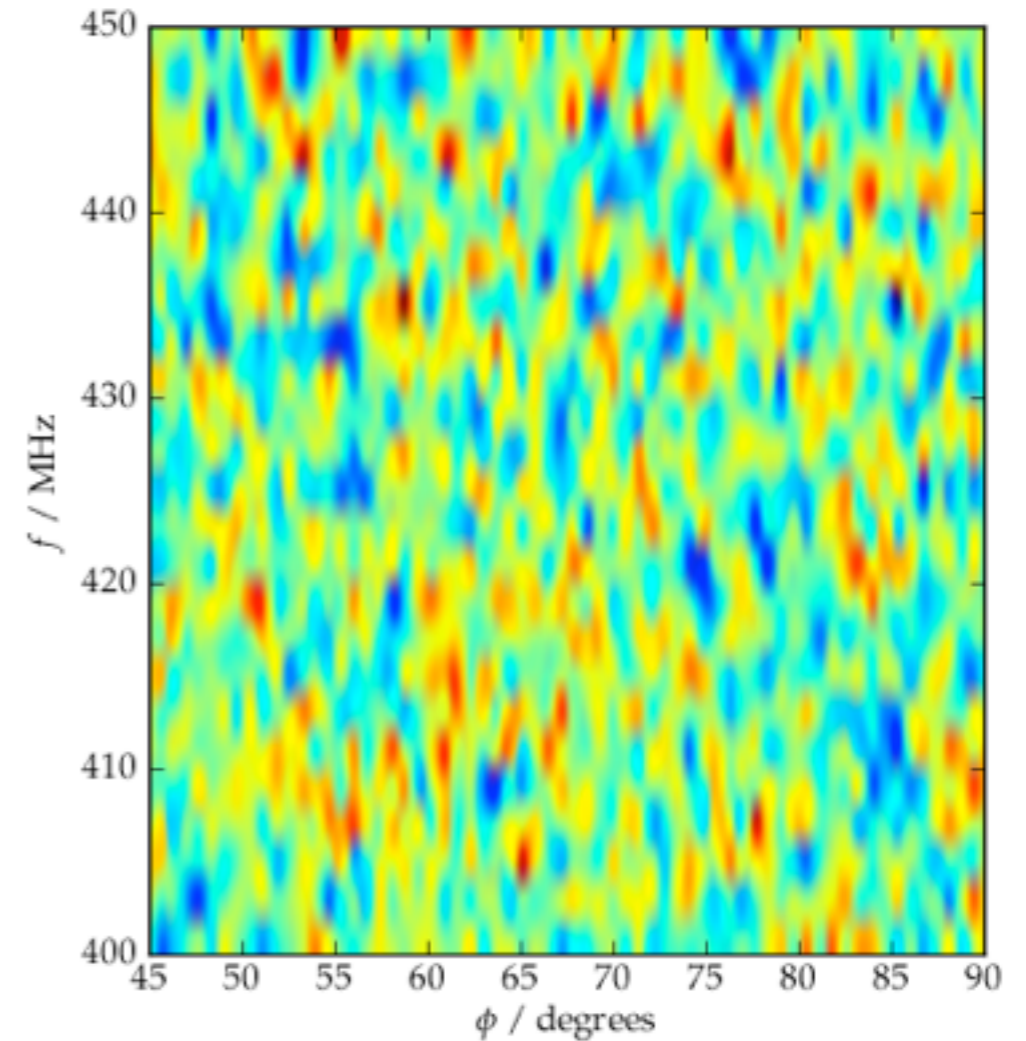
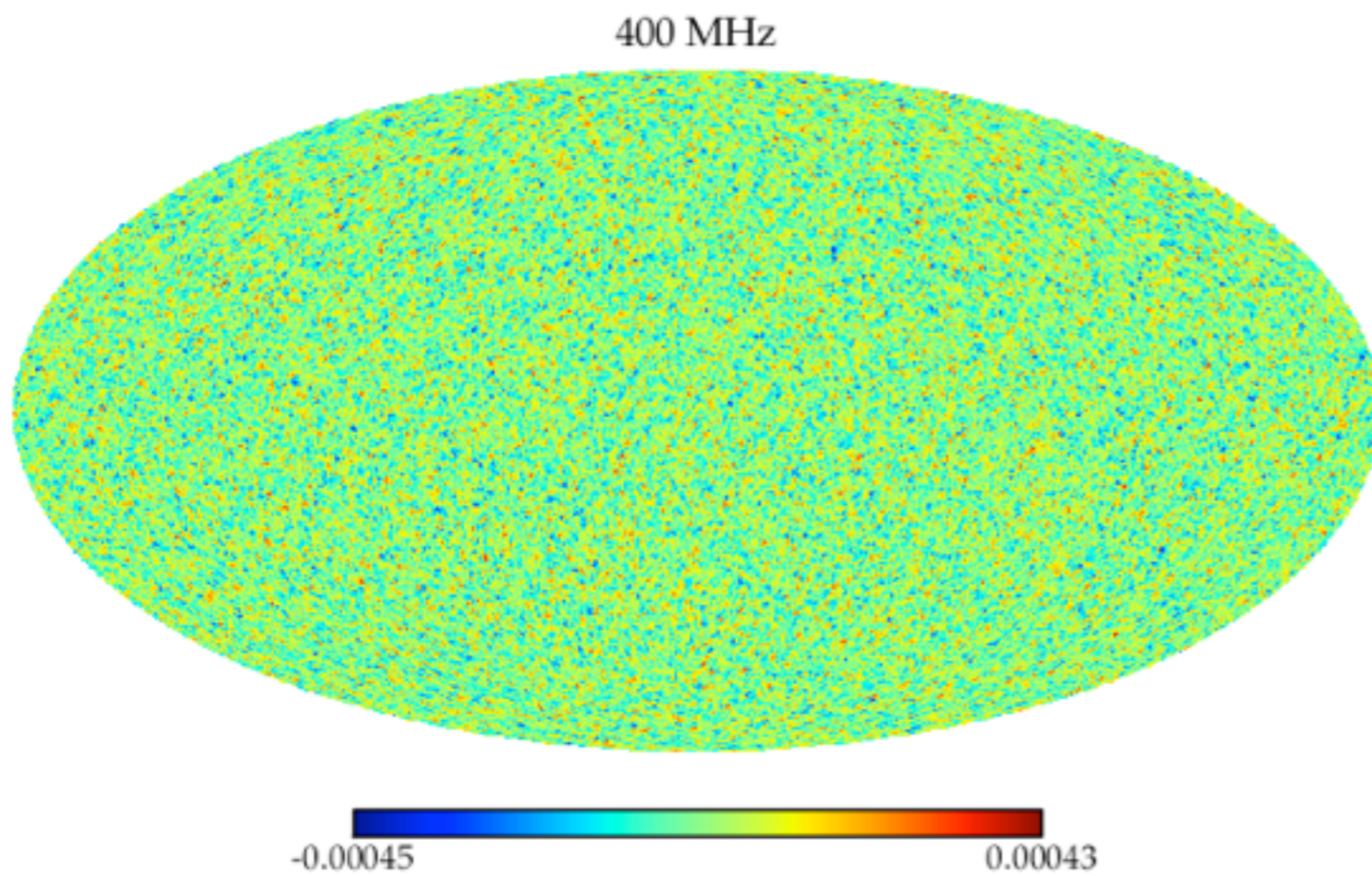
Observed map

$$\hat{\mathbf{a}} = \left(\mathbf{N}^{-\frac{1}{2}} \mathbf{B} \right)^+ \mathbf{N}^{-\frac{1}{2}} \mathbf{v}$$



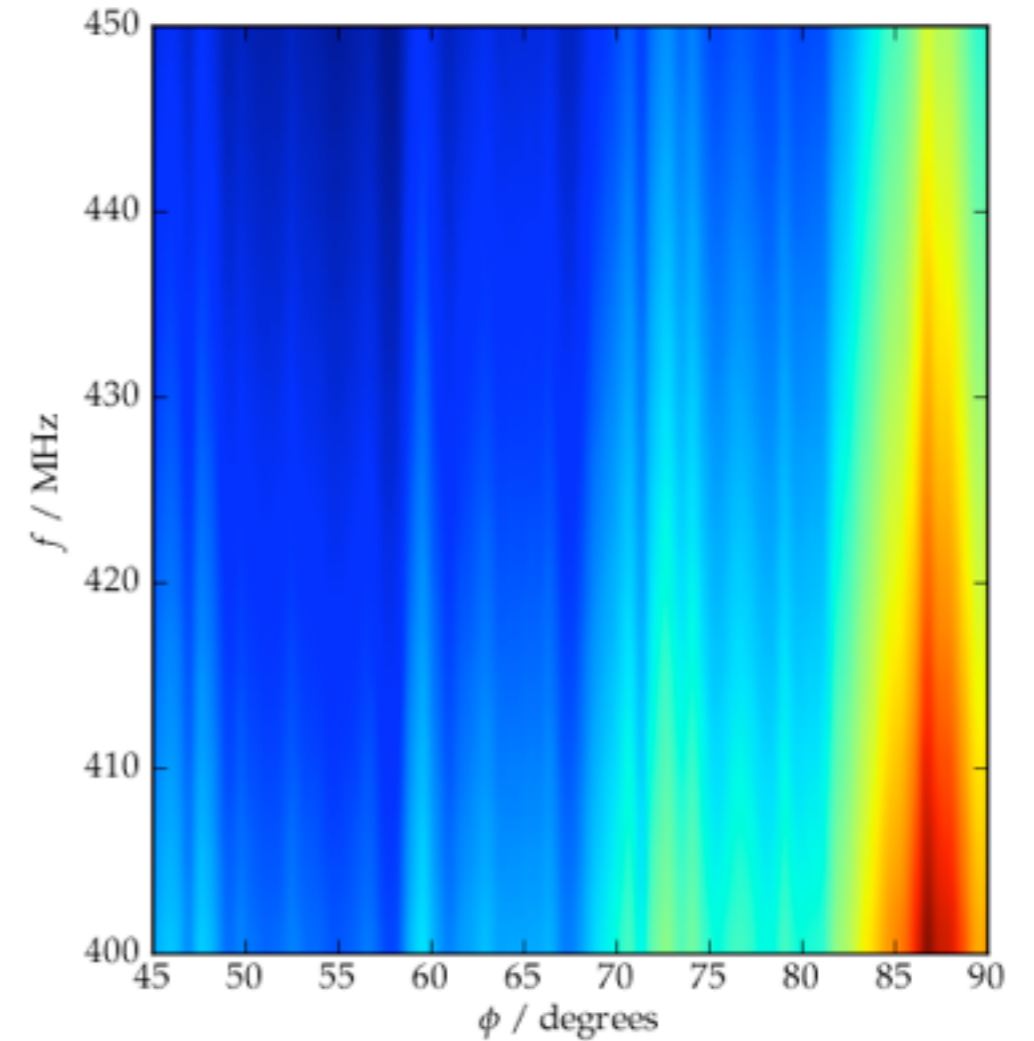
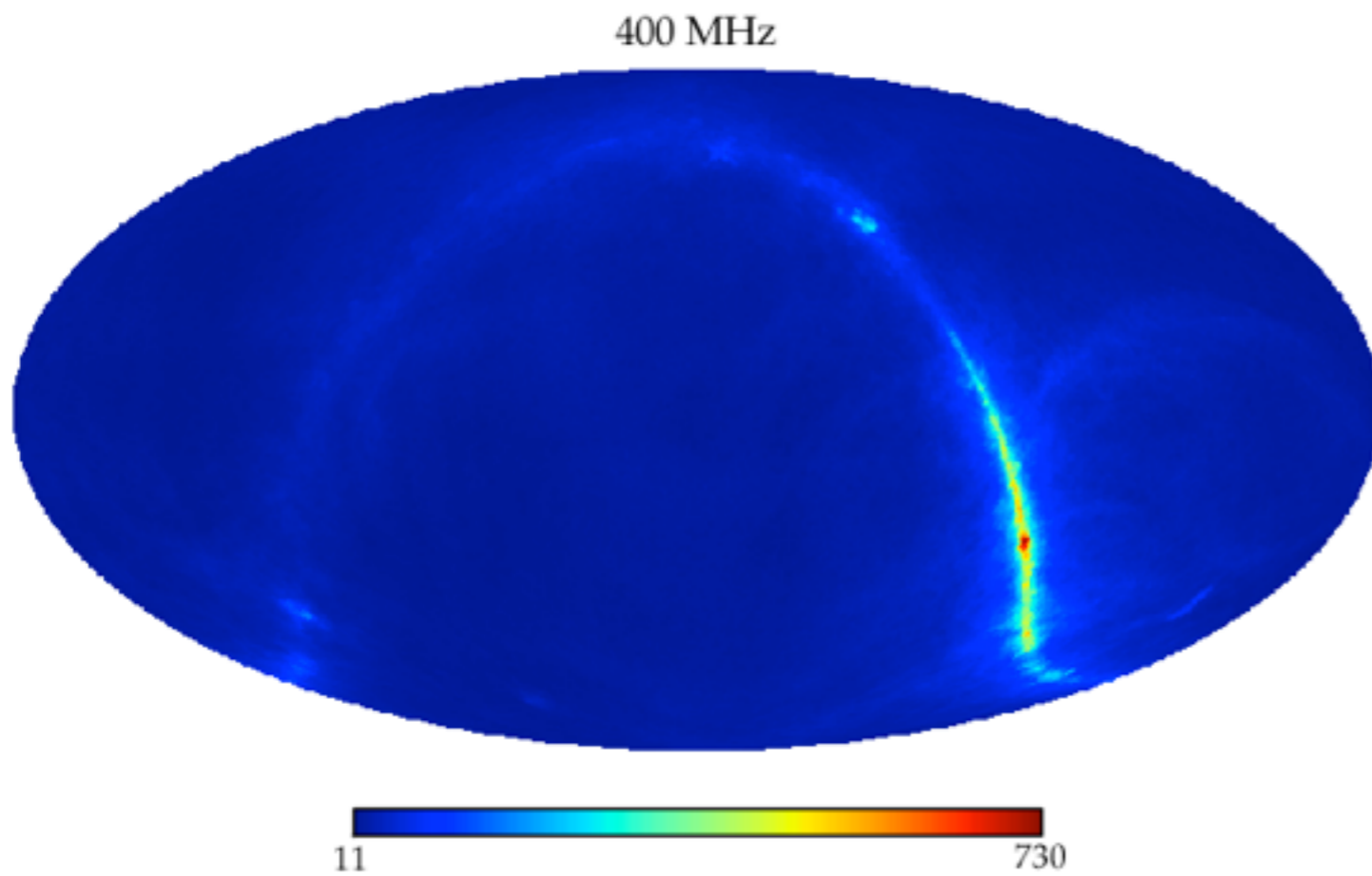
2x15m wide cylinders, 60 feeds, 0.25m spacing 400-600 MHz

Foreground Challenges



Cosmological 21cm Signal $\sim 1\text{mK}$

Foreground Challenges



Galaxy: up to 700K

Foreground Removal

- Spectral smoothness allows separation of 21cm
 - ▶ Measure components and model (Liu, Dillon etc.)
 - ▶ Power spectrum removal (Foreground wedge)
 - ▶ Delay-space filtering (Parsons et al. 2012)
- Most methods have difficulties:
 - ▶ *Mode mixing* of angular and frequency fluctuations by frequency-dependent beams (esp. interferometers)
 - ▶ *Robustness* Biasing introduced if foreground model poorly understood (esp. non-gaussianities)
 - ▶ *Statistical Optimality* Need to keep track of transformations on statistics, for optimal PS estimation
 - ▶ *Polarisation leakage* mixes fluctuations from polarised foreground

Signal to Noise Eigenmodes

- Old CMB idea - E/B mode separation (Bunn et al. 2003)
- An 'optimal' treatment - m-modes makes it feasible.
- Construct the covariances of the signal and foregrounds in the measured basis

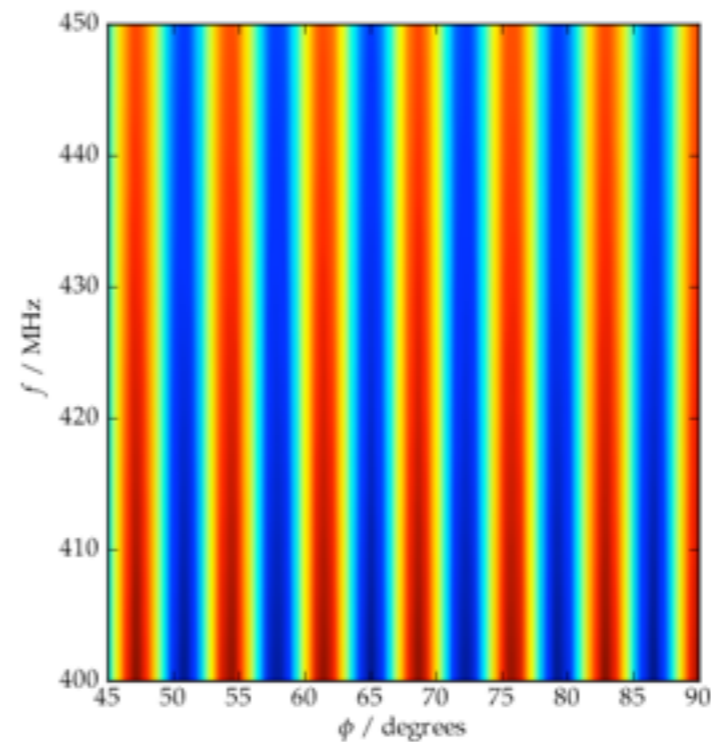
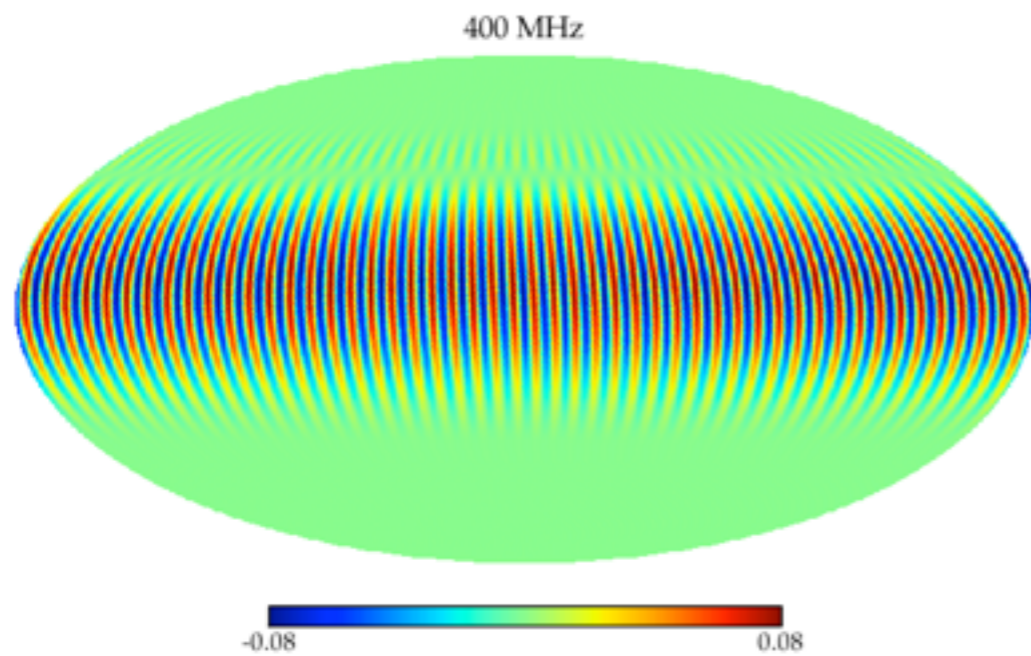
$$\mathbf{S} = \langle \mathbf{s} \mathbf{s}^\dagger \rangle = \mathbf{B} \langle \mathbf{a}_s^* \mathbf{a}_s^T \rangle \mathbf{B}^\dagger \quad \mathbf{F} = \mathbf{B} \langle \mathbf{a}_f \mathbf{a}_f^\dagger \rangle \mathbf{B}^\dagger$$

- Jointly diagonalise both (eigenvalue problem)

$$\mathbf{S} \mathbf{x} = \lambda \mathbf{F} \mathbf{x}$$

- Gives a new, uncorrelated basis. Corresponding eigenvalue gives the expected signal to foreground power ratio.

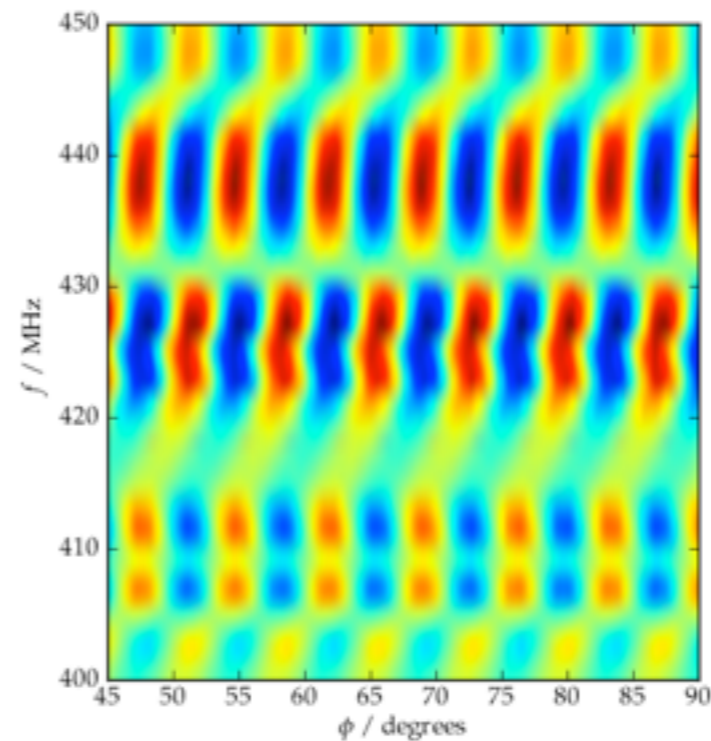
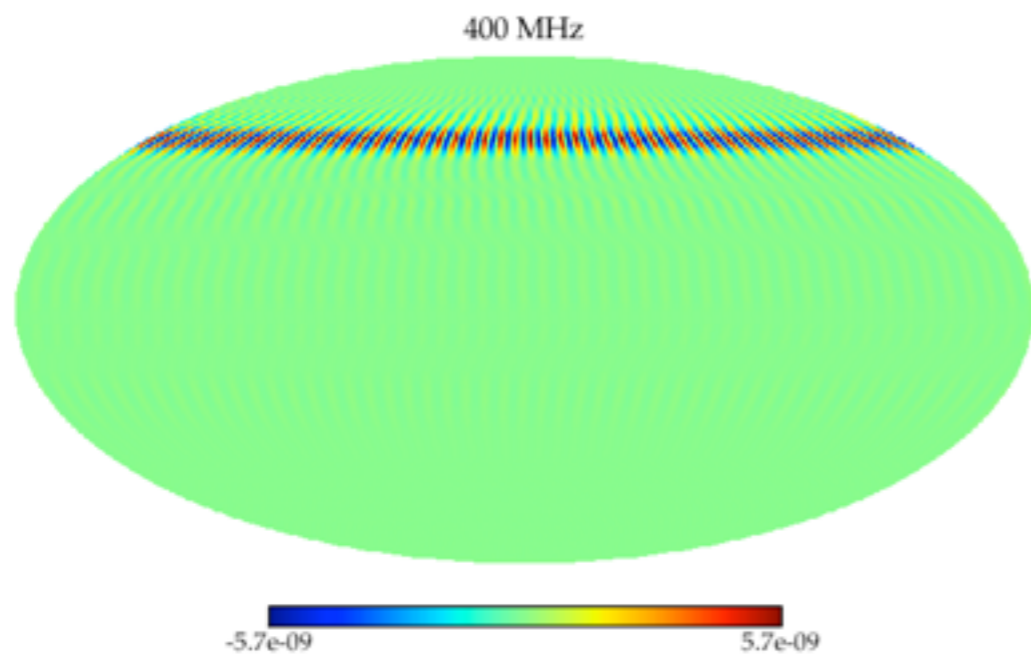
Most foreground



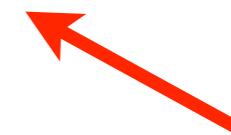
smooth
in freq



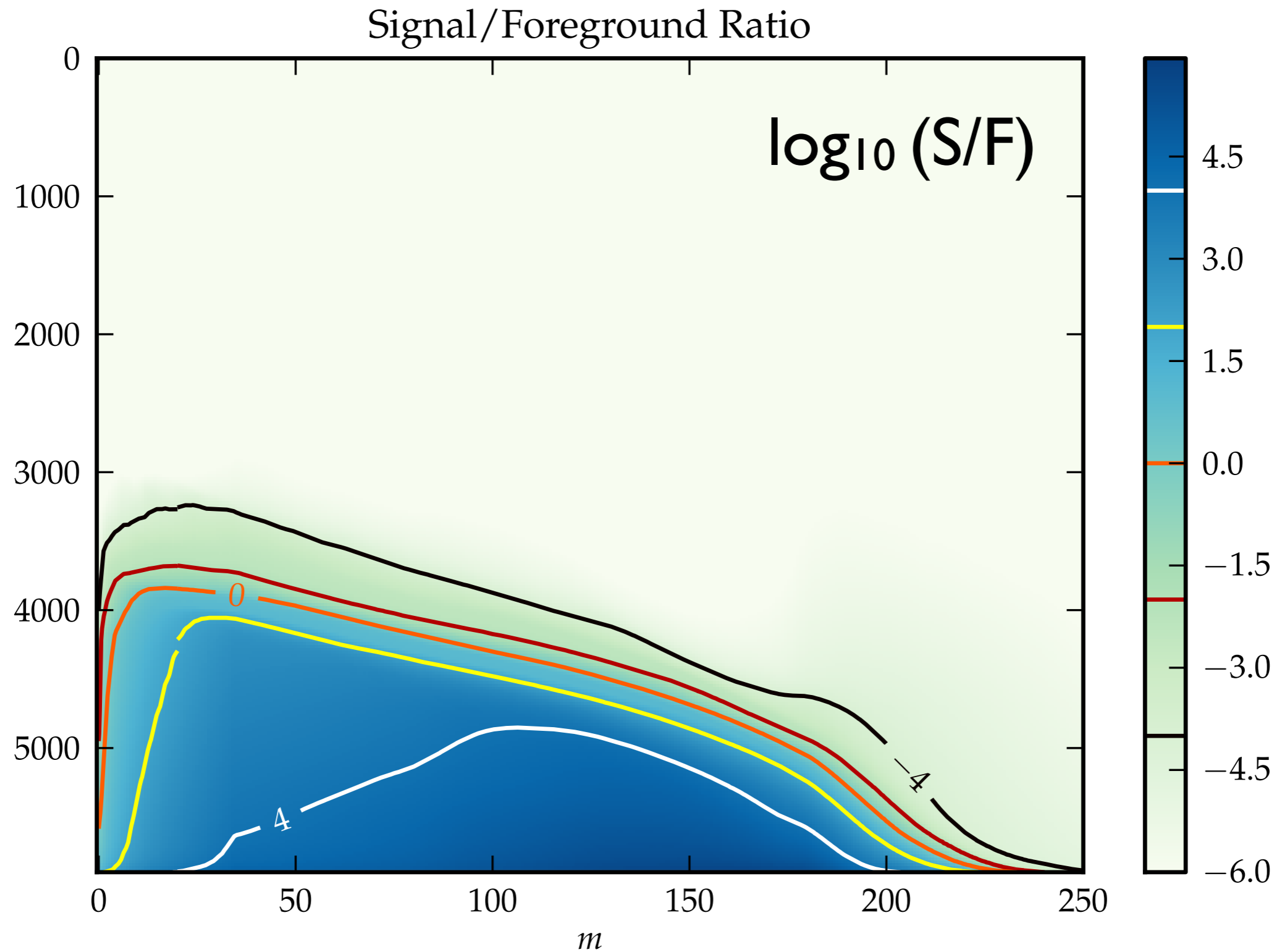
Most signal



oscillates
in freq



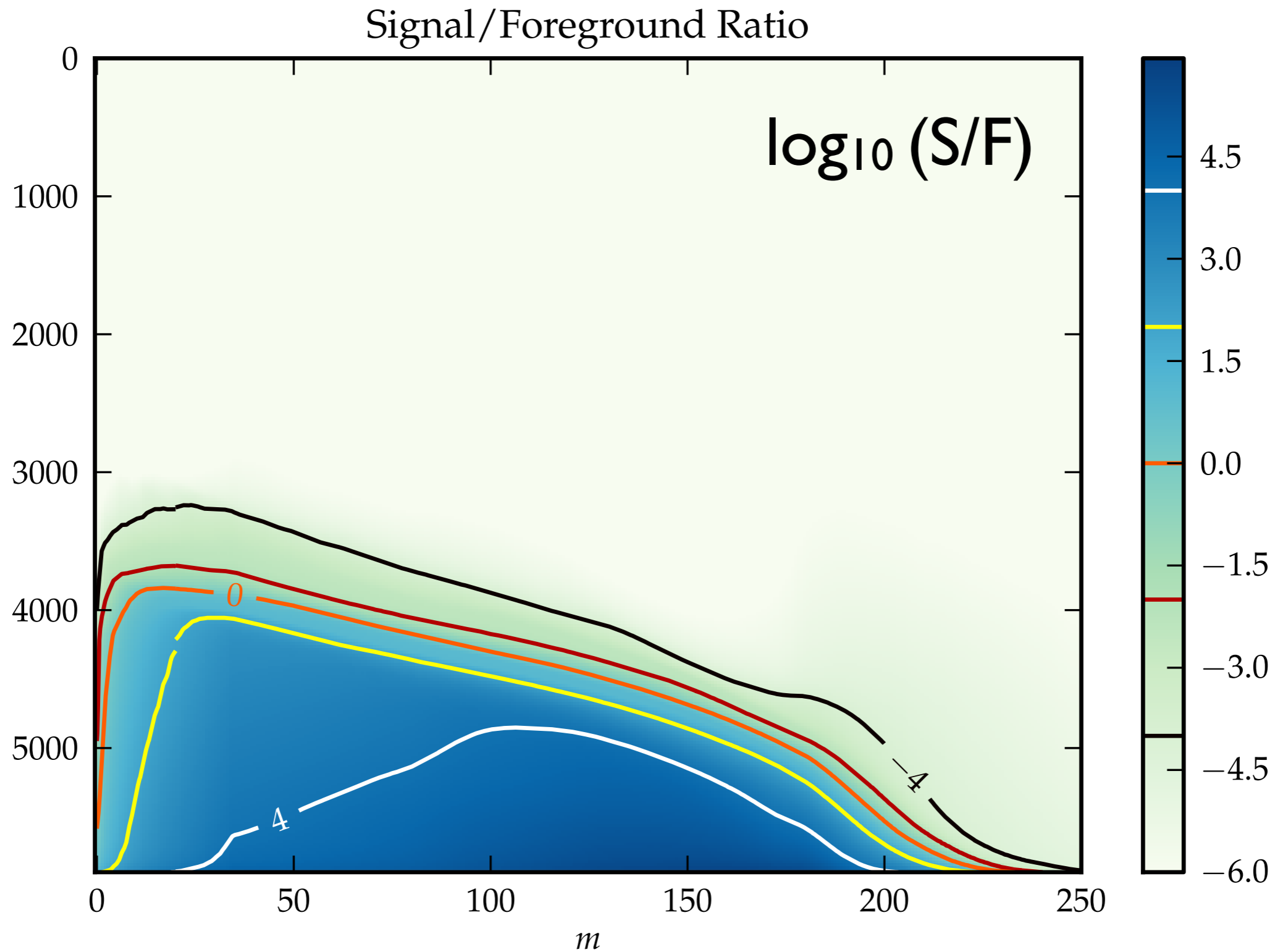
Signal/Foreground Ratio



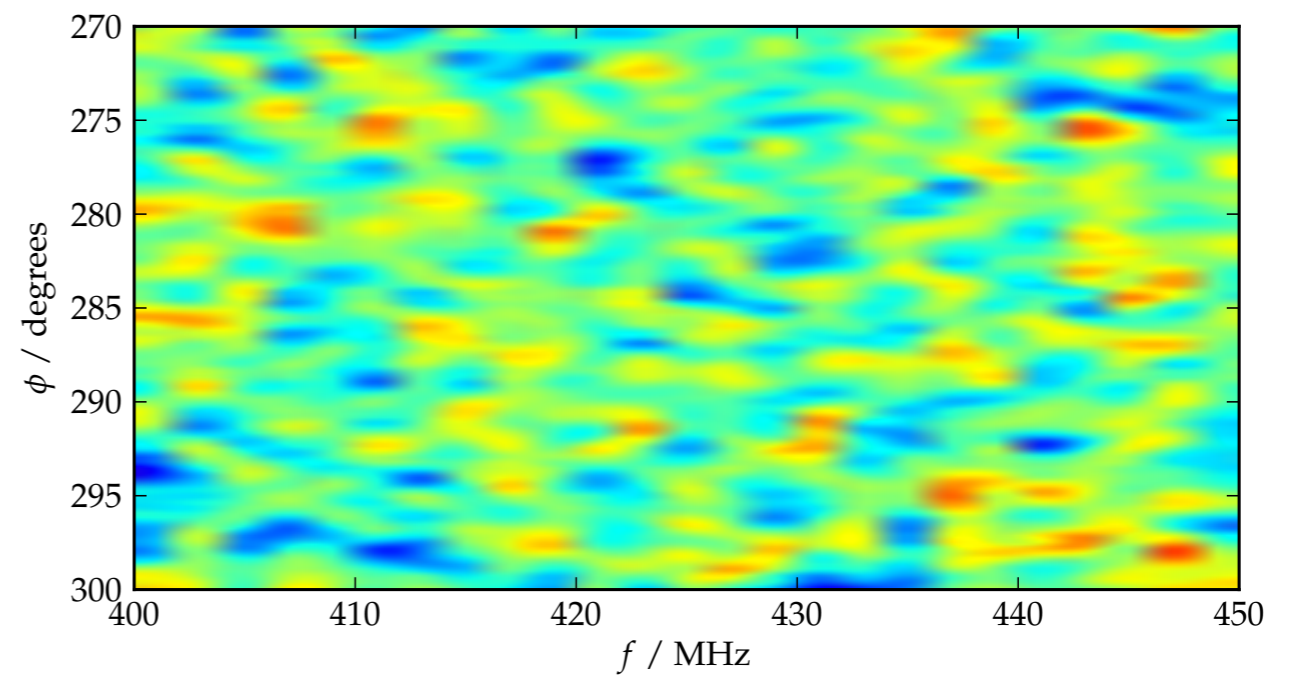
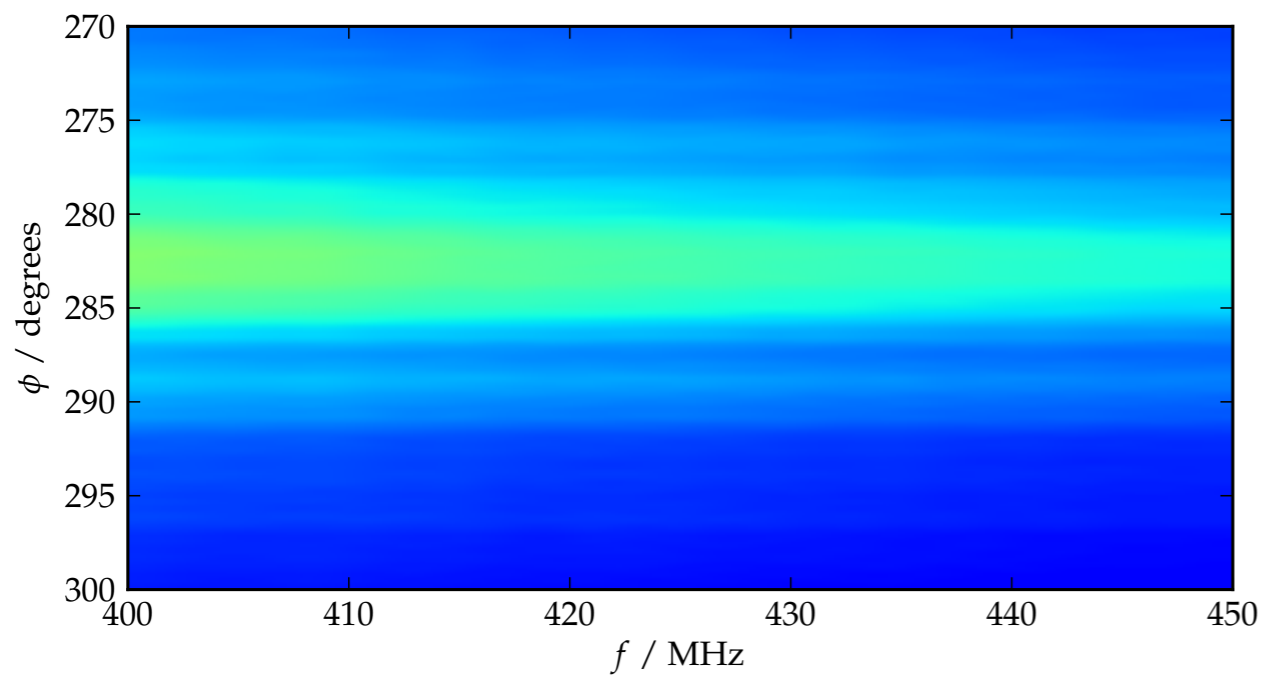
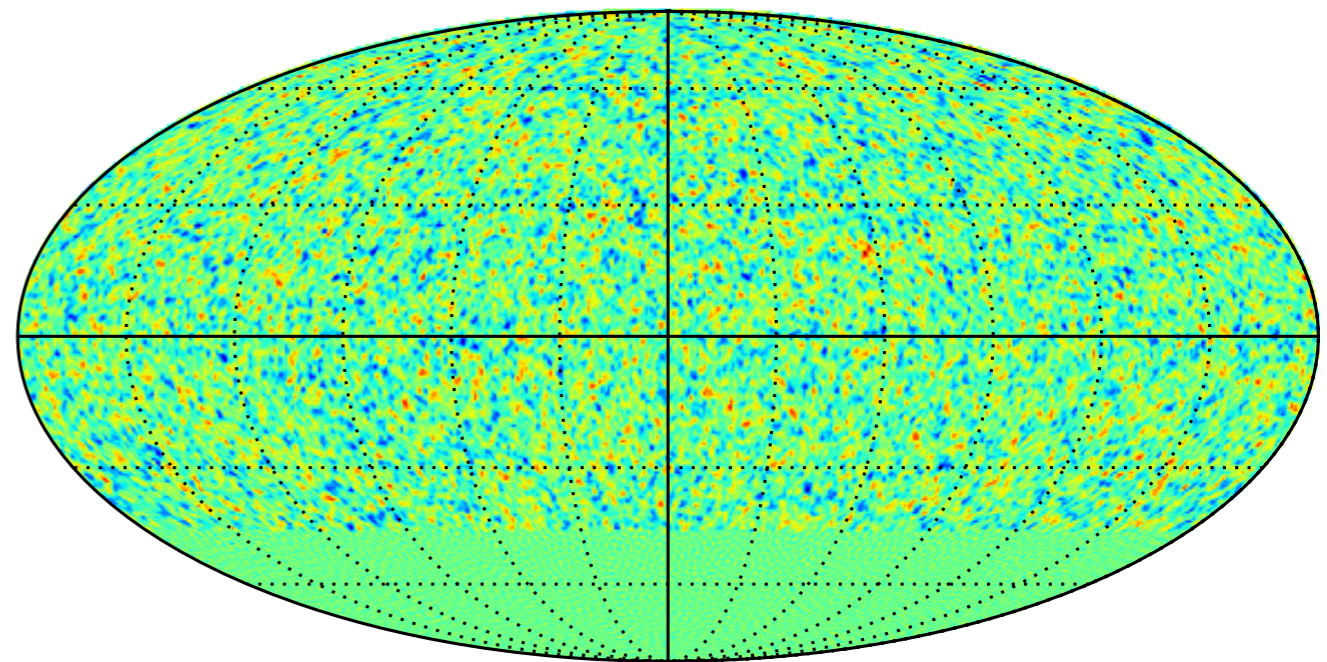
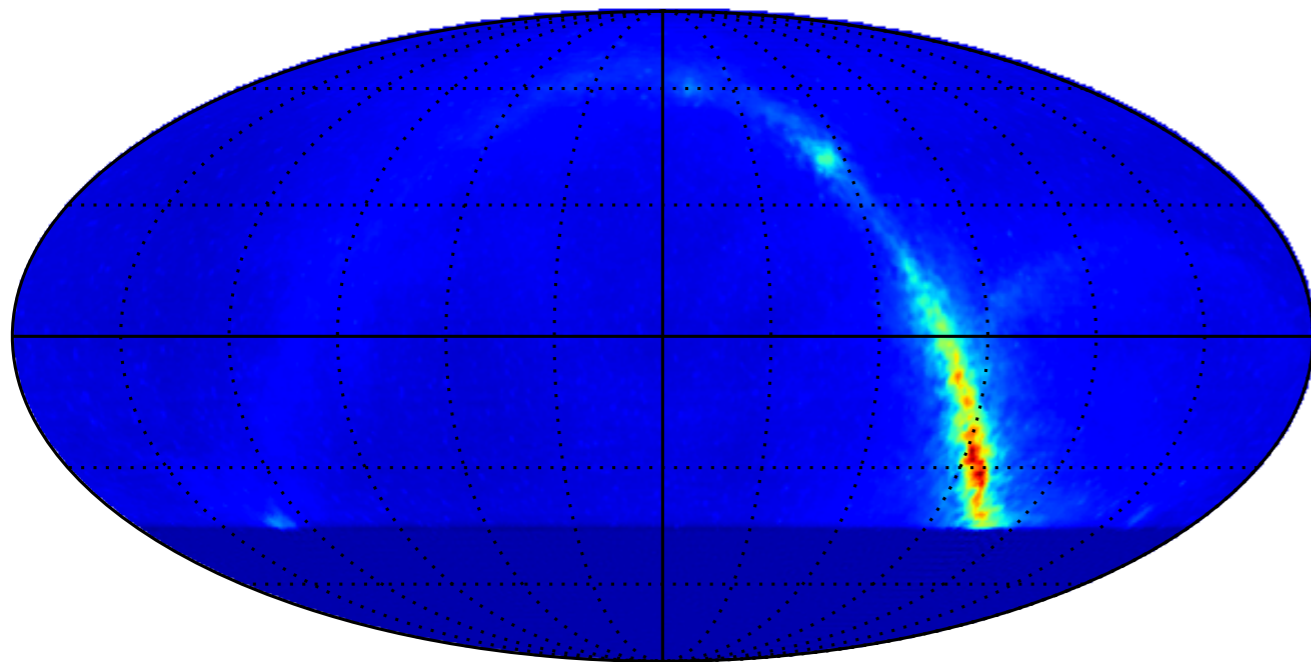
Foreground Removal with S/N modes

- Foreground removal is performed by projecting out modes with low signal-to-foreground ratio.
- Robustness to model uncertainties by choosing a conservatively large threshold; we would prefer to increase our errors bars in order to remove bias.
- Addresses the previous problems
 - ▶ Analysis uses all measured data to avoid mode mixing.
 - ▶ Can be made arbitrarily robust - increase threshold for removal
 - ▶ Linear transformation in the data space, keeps track of statistics

Signal/Foreground Ratio

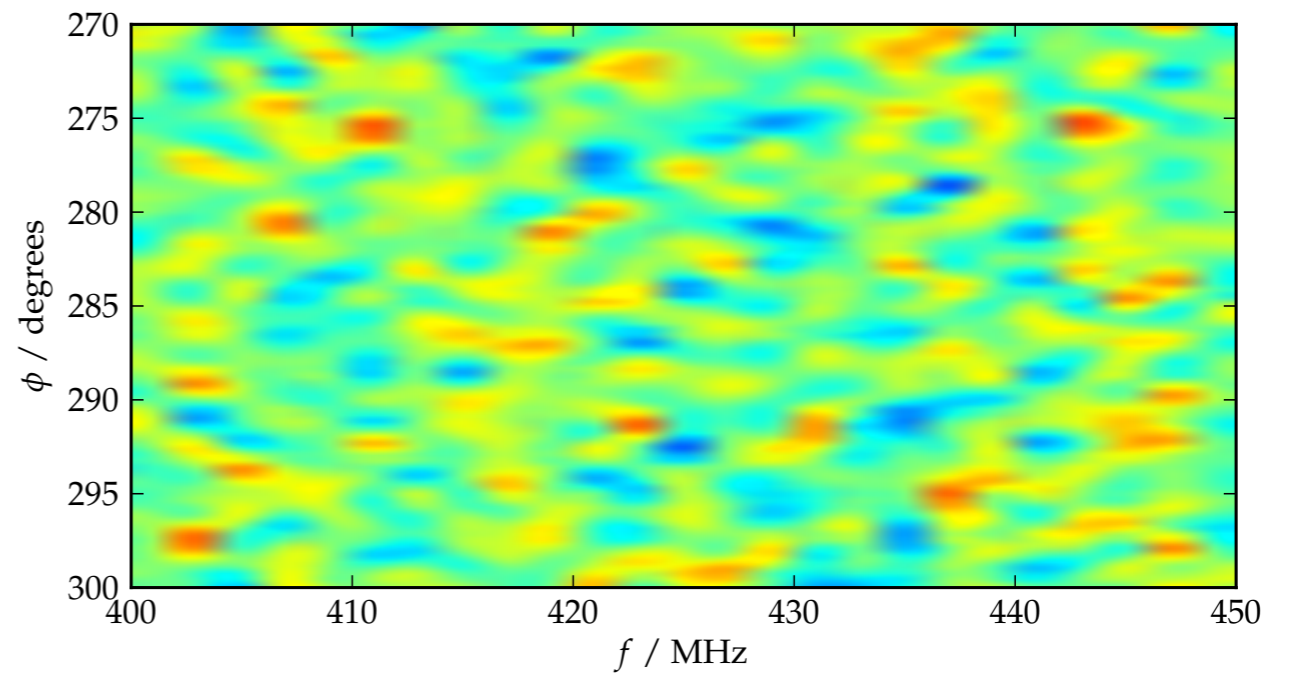
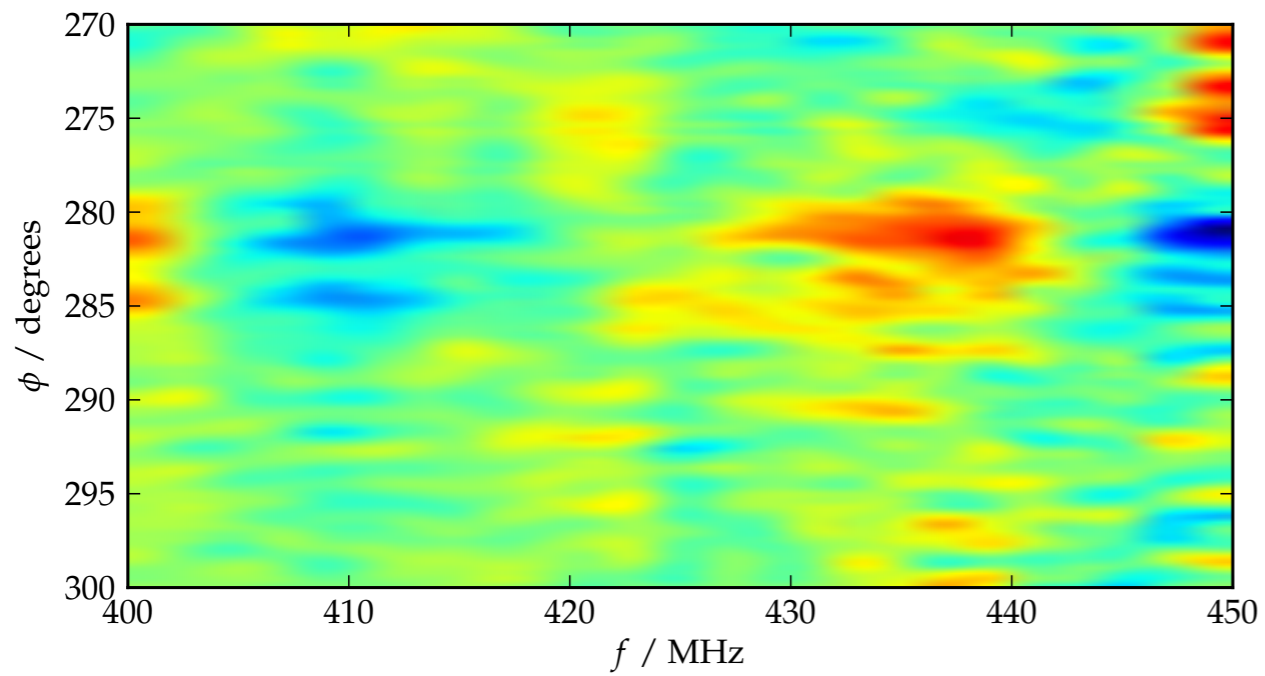
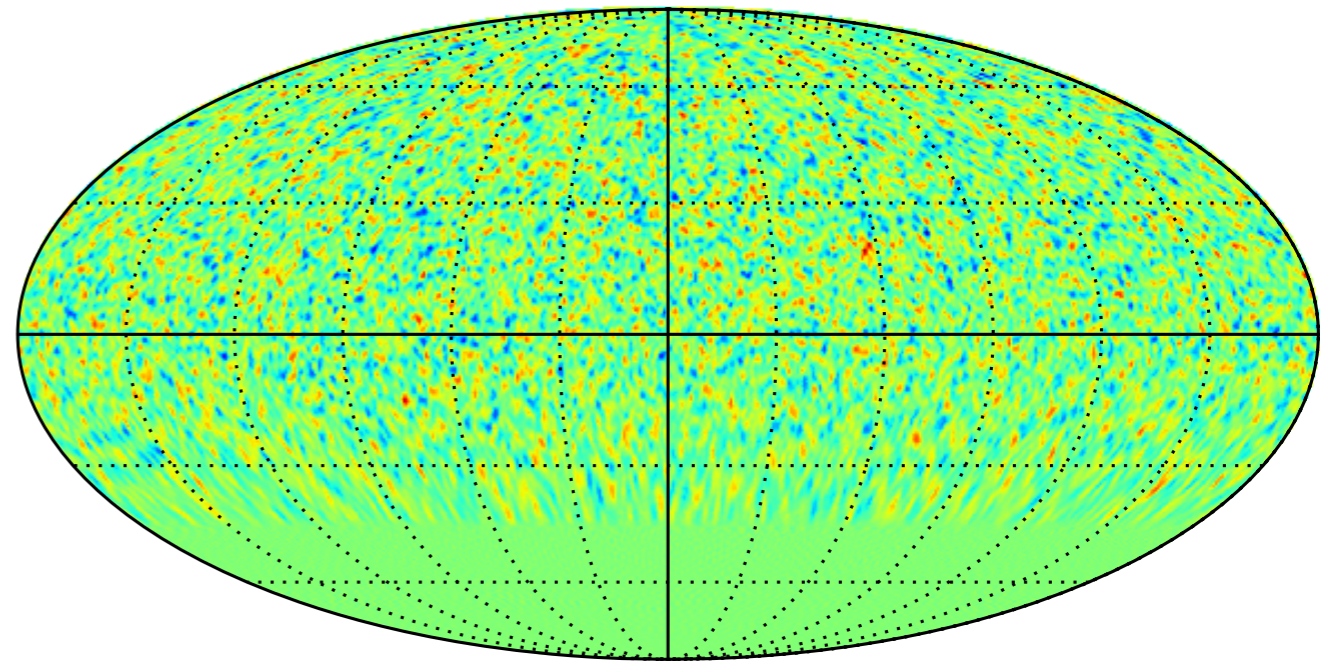
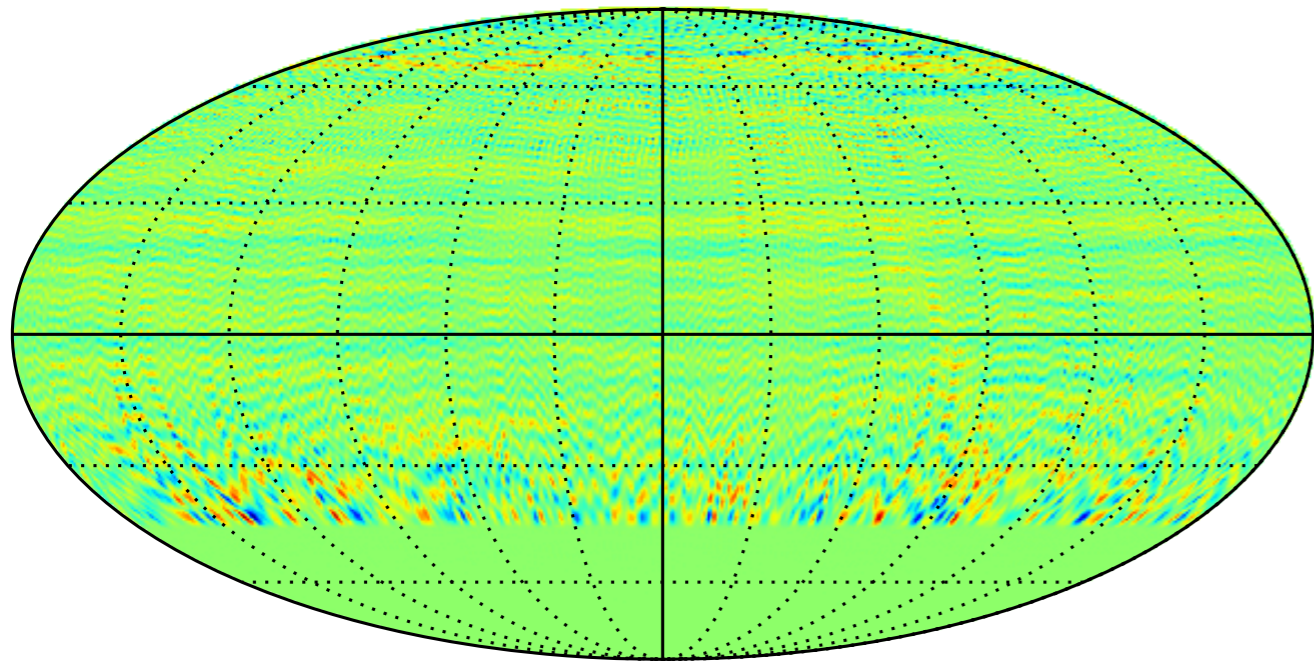


Observed sky (from simulated time stream)



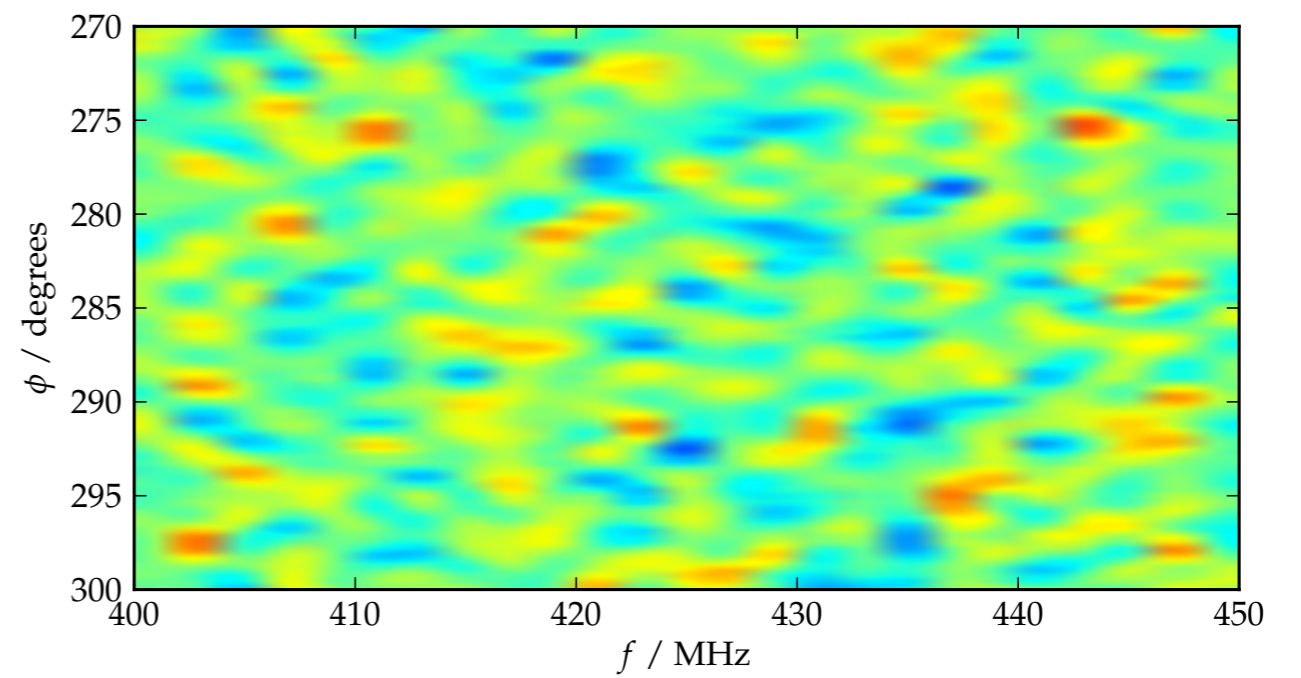
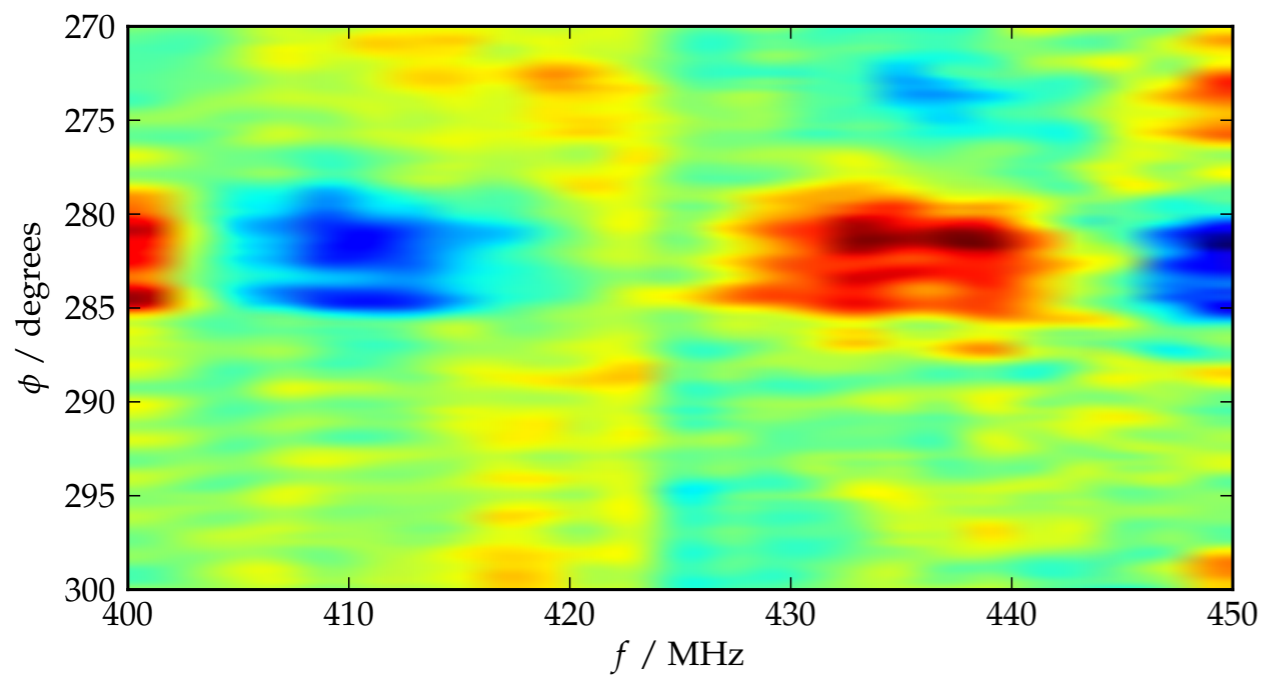
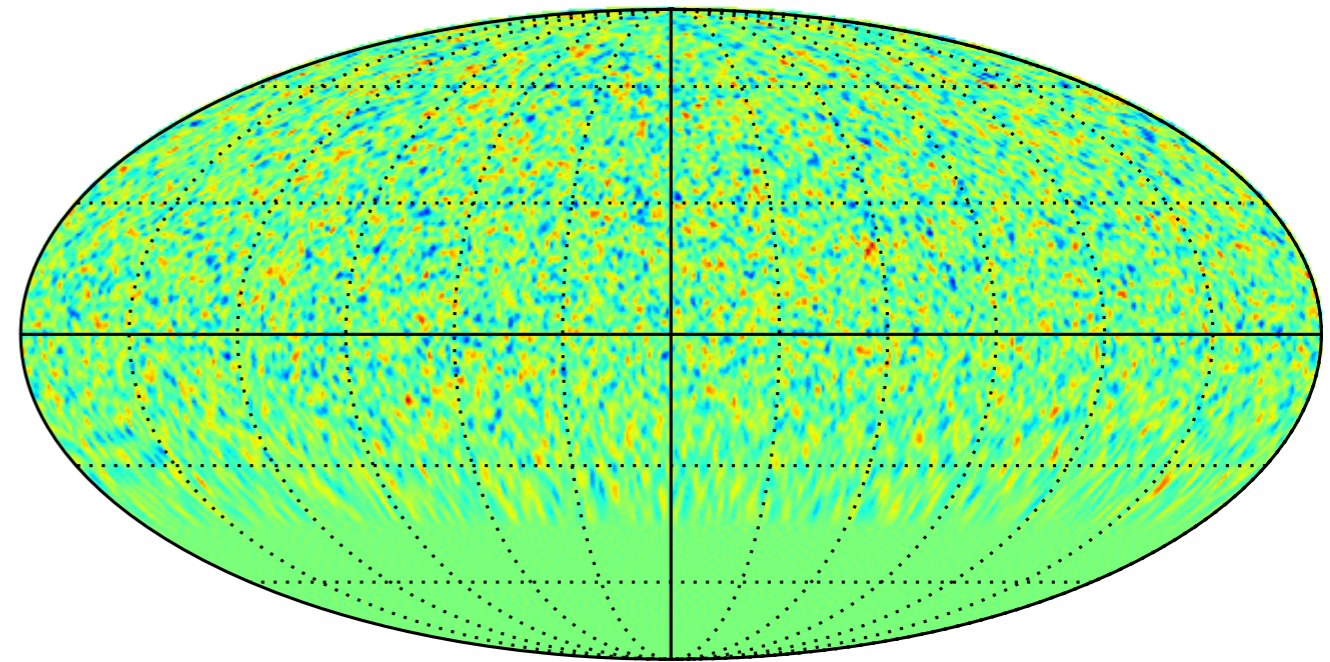
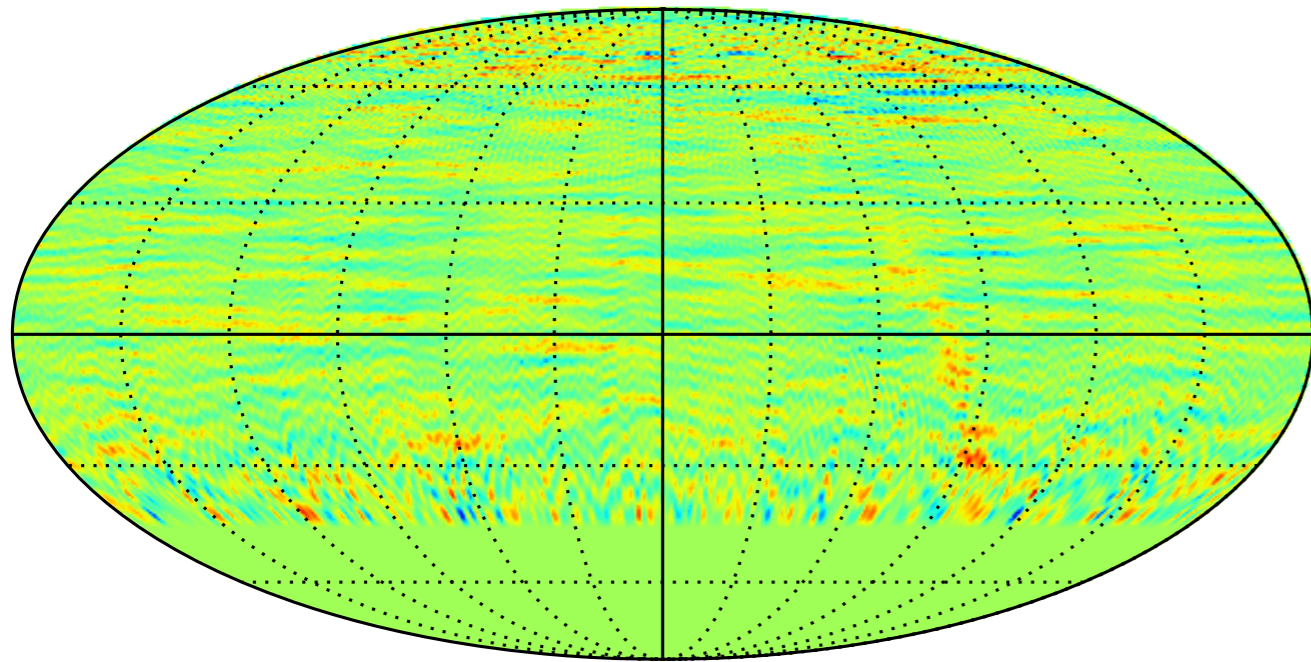
$\sim 10^6$ x brighter

$S/F > 0.01$



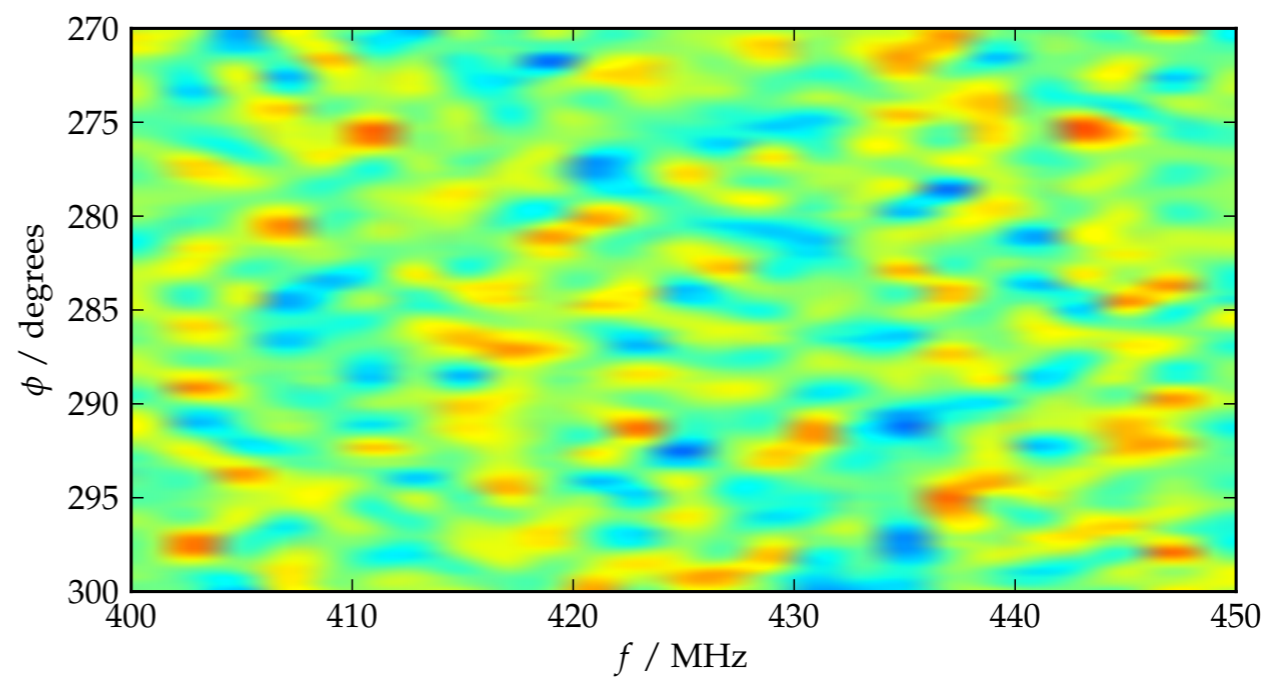
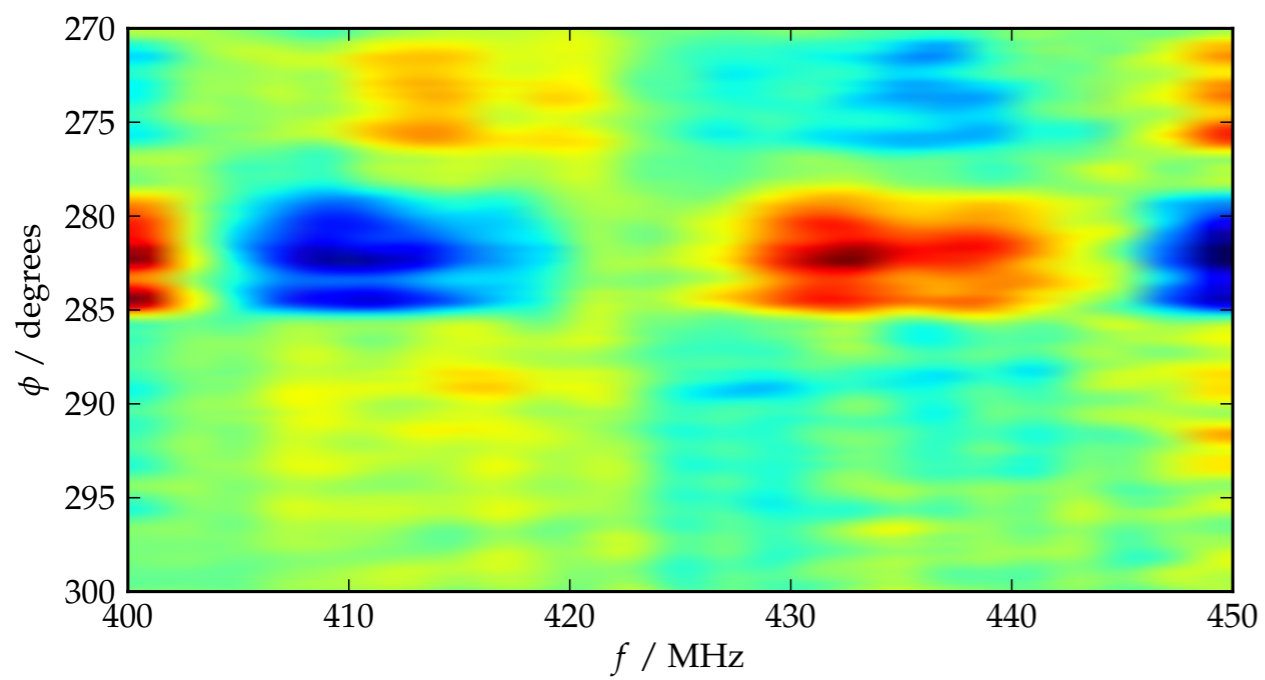
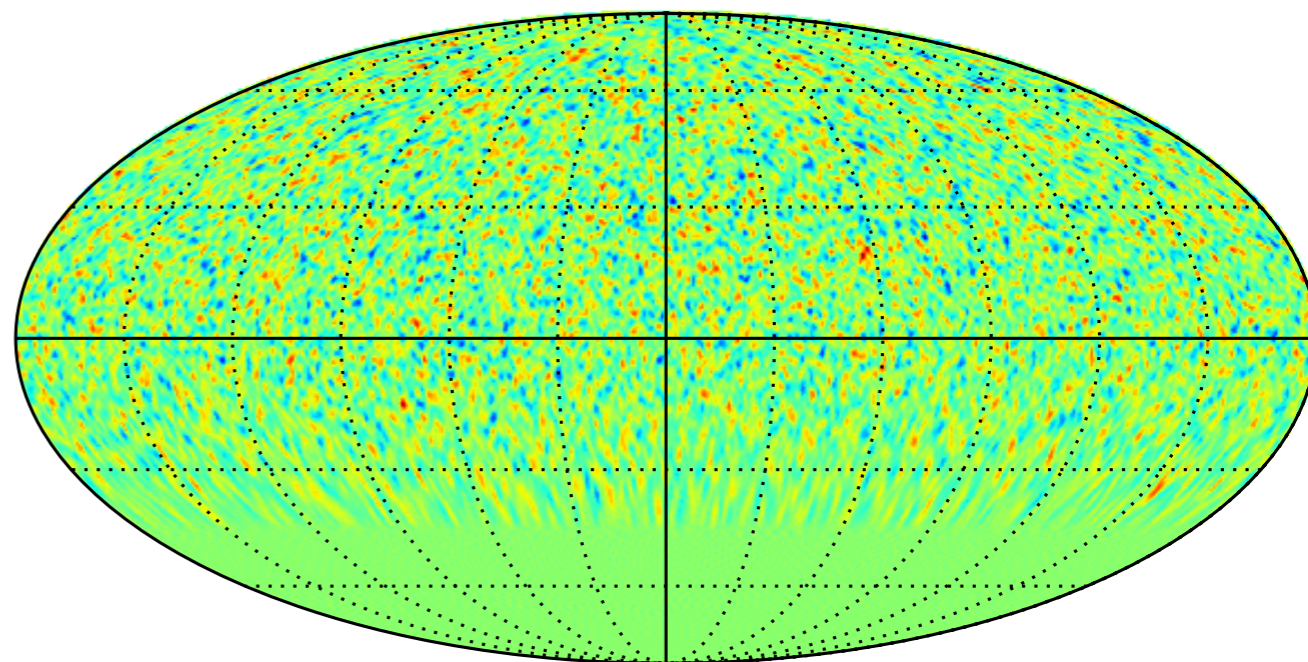
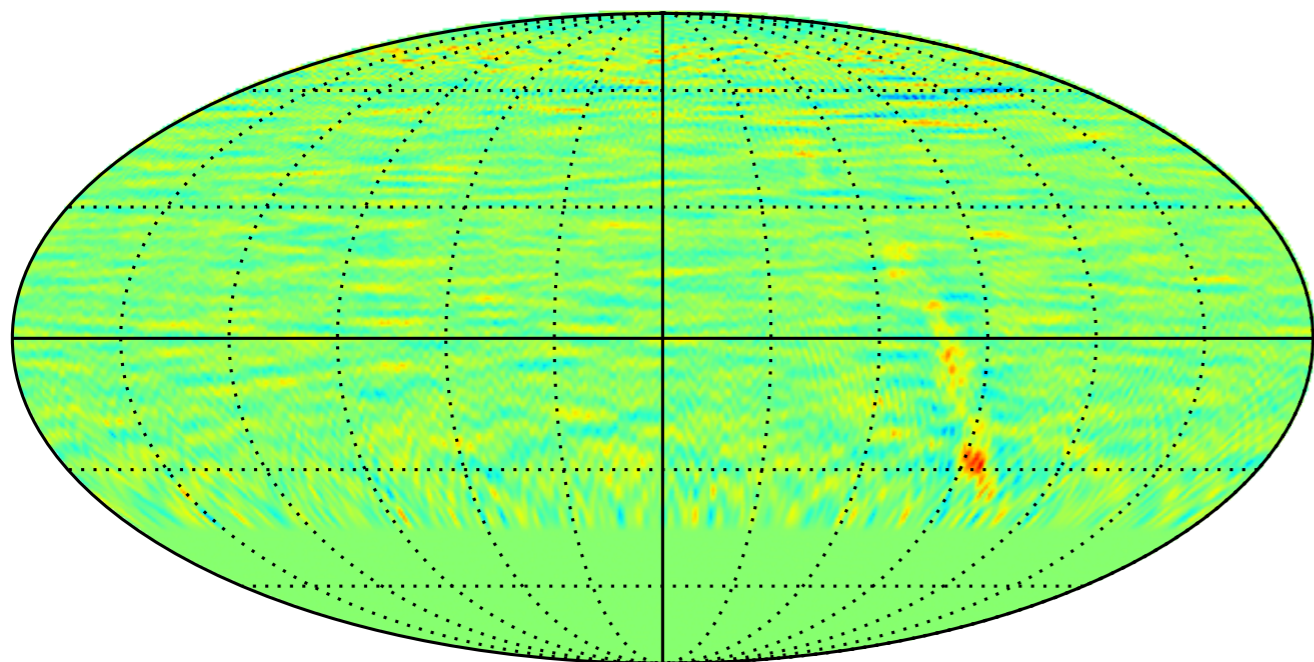
\sim same brightness

$S/F > 0.1$



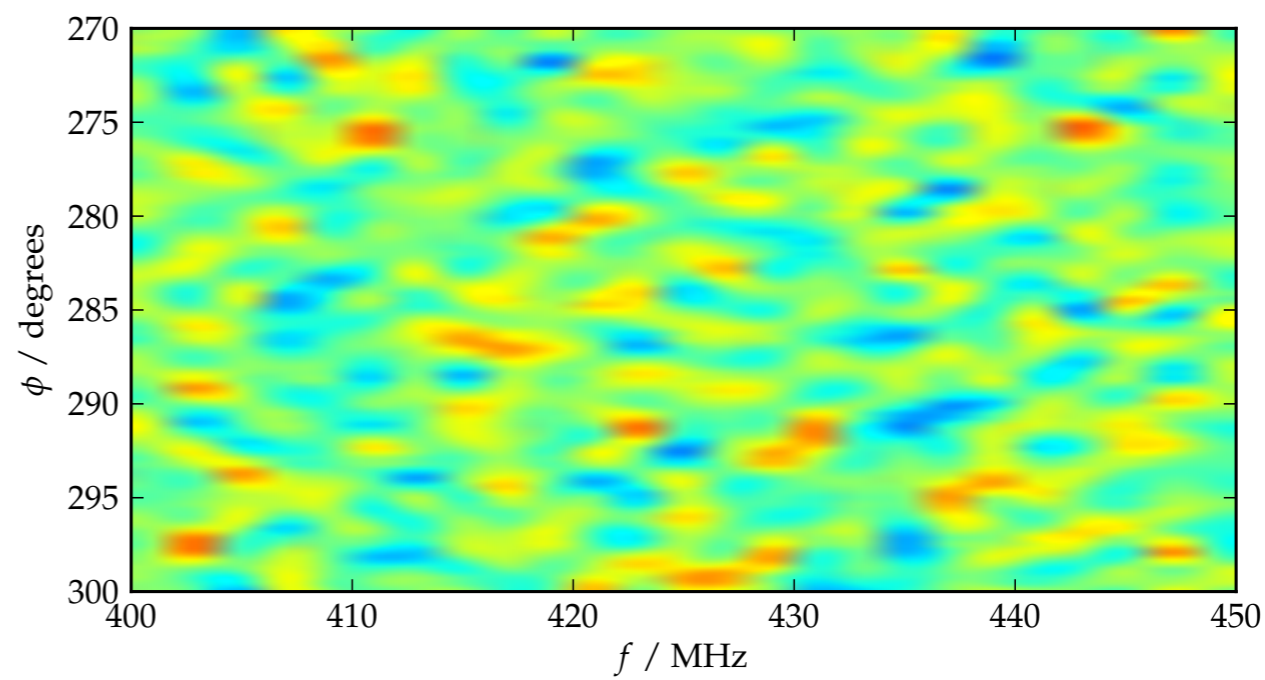
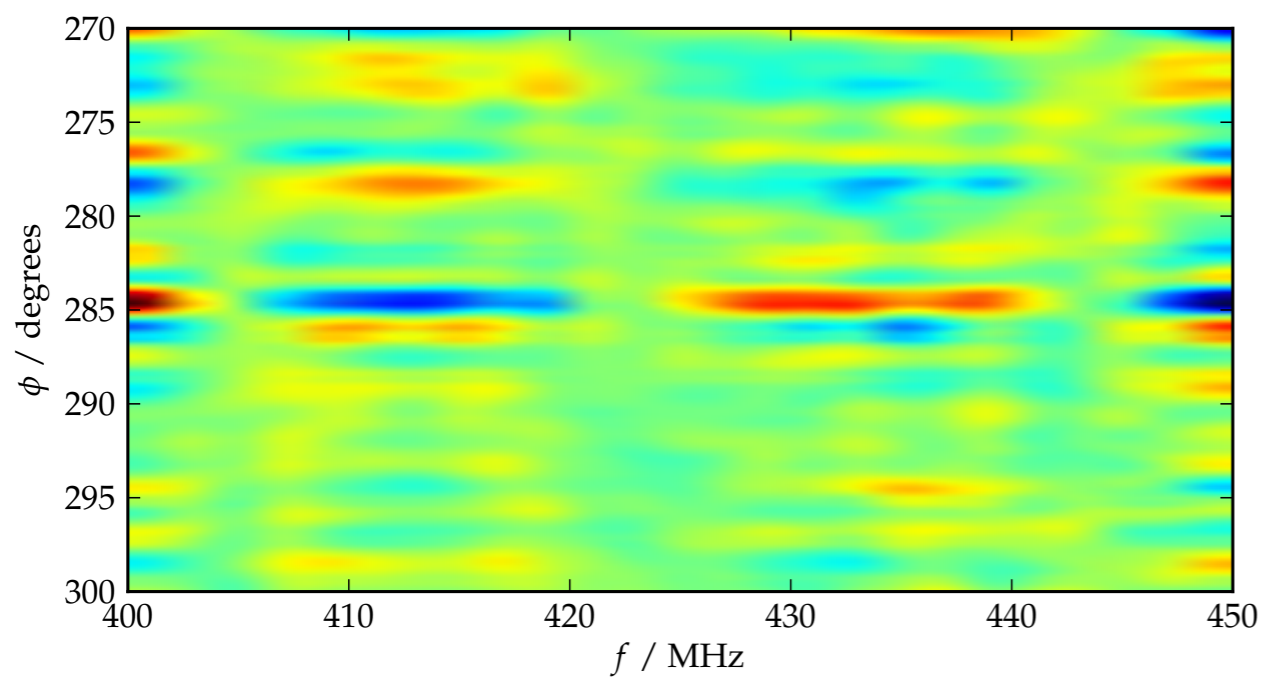
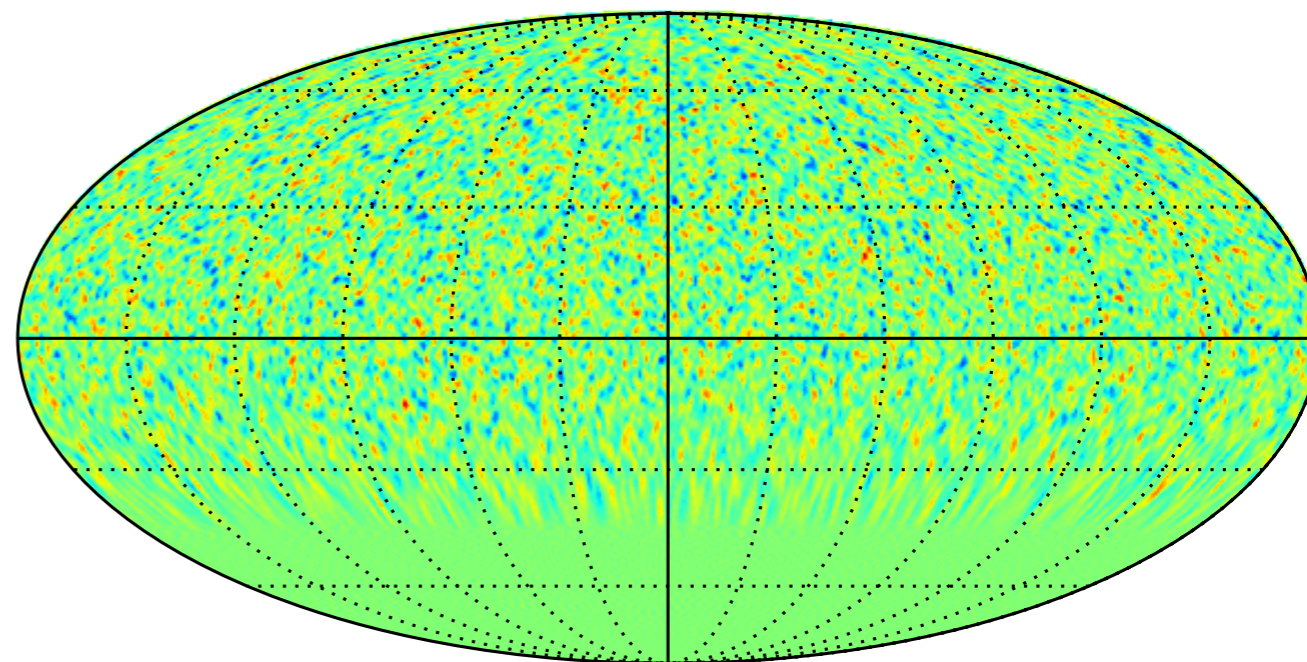
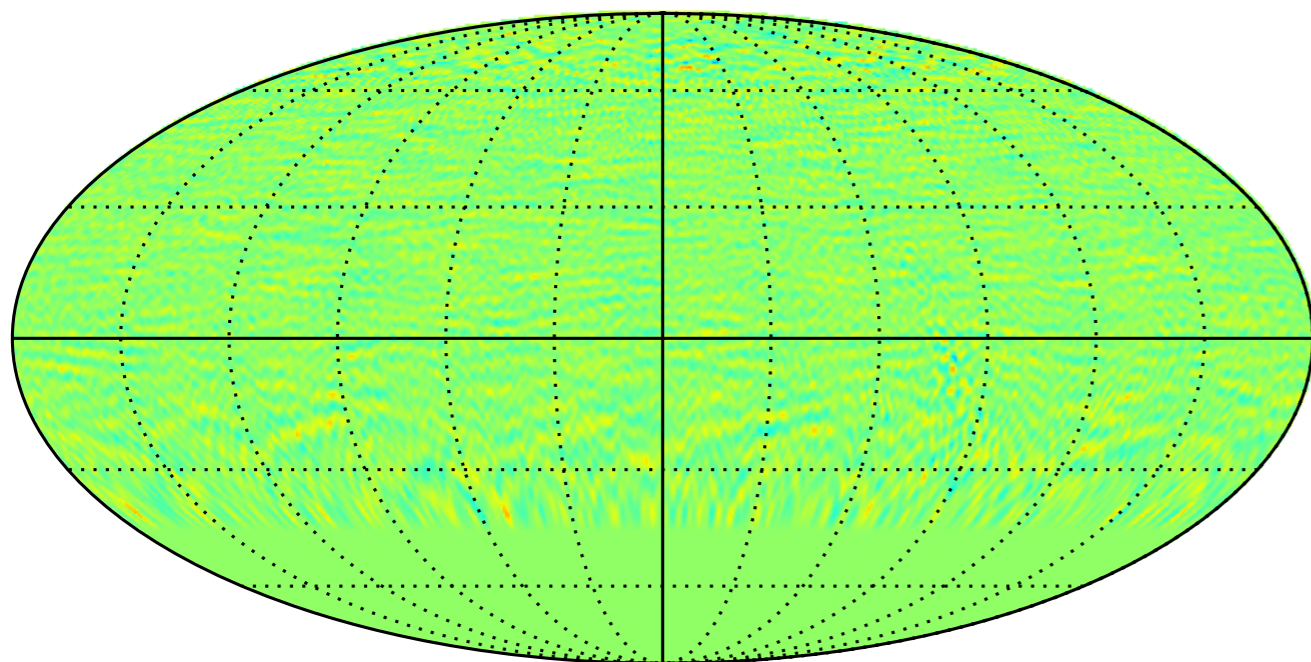
$\sim 3x$ dimmer

$S/F > 1$



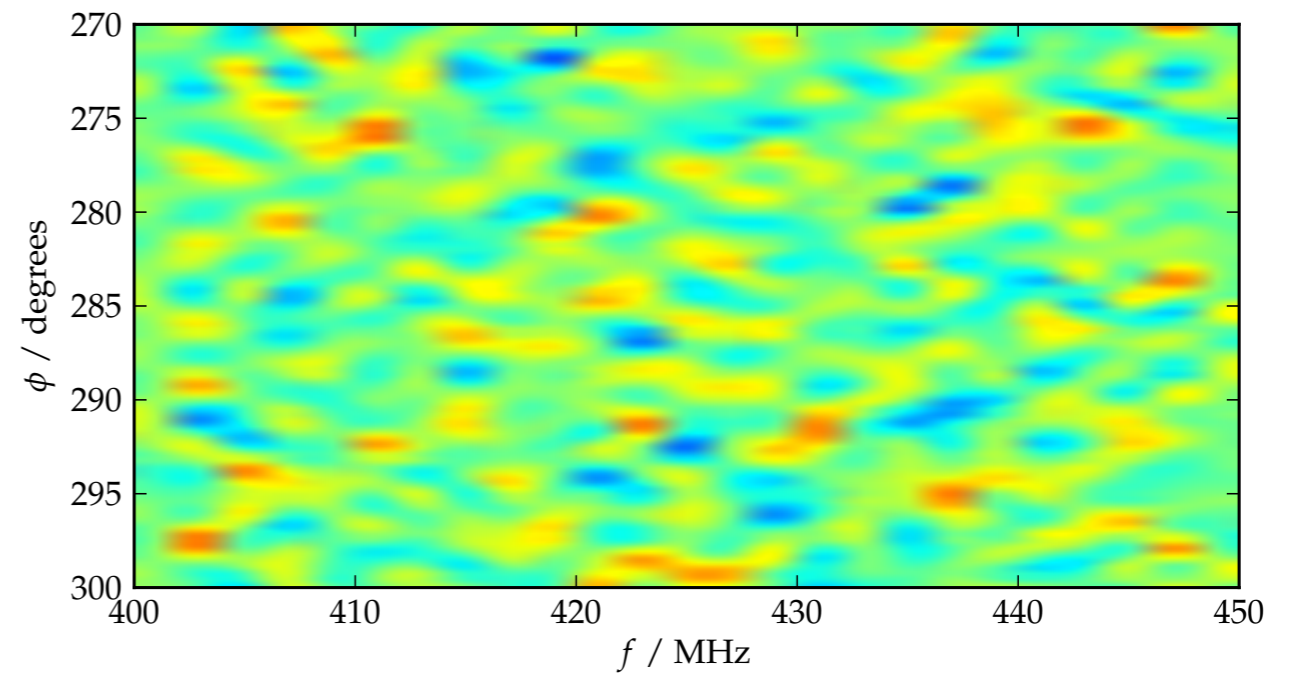
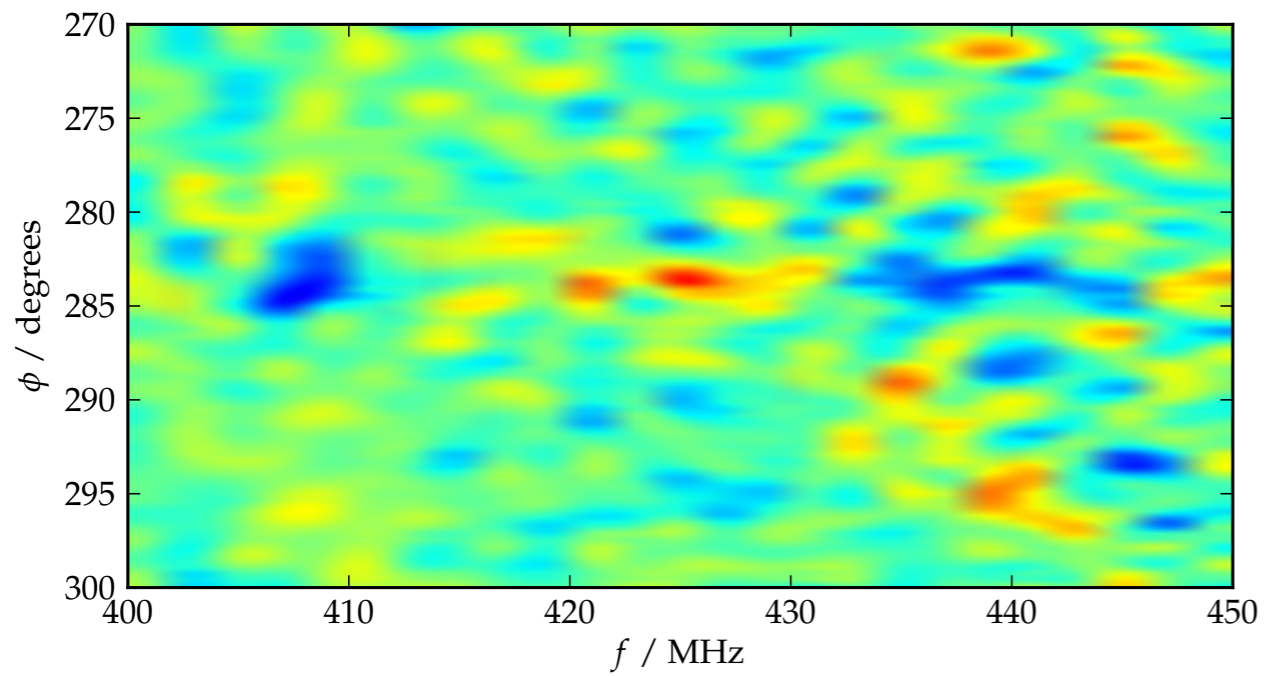
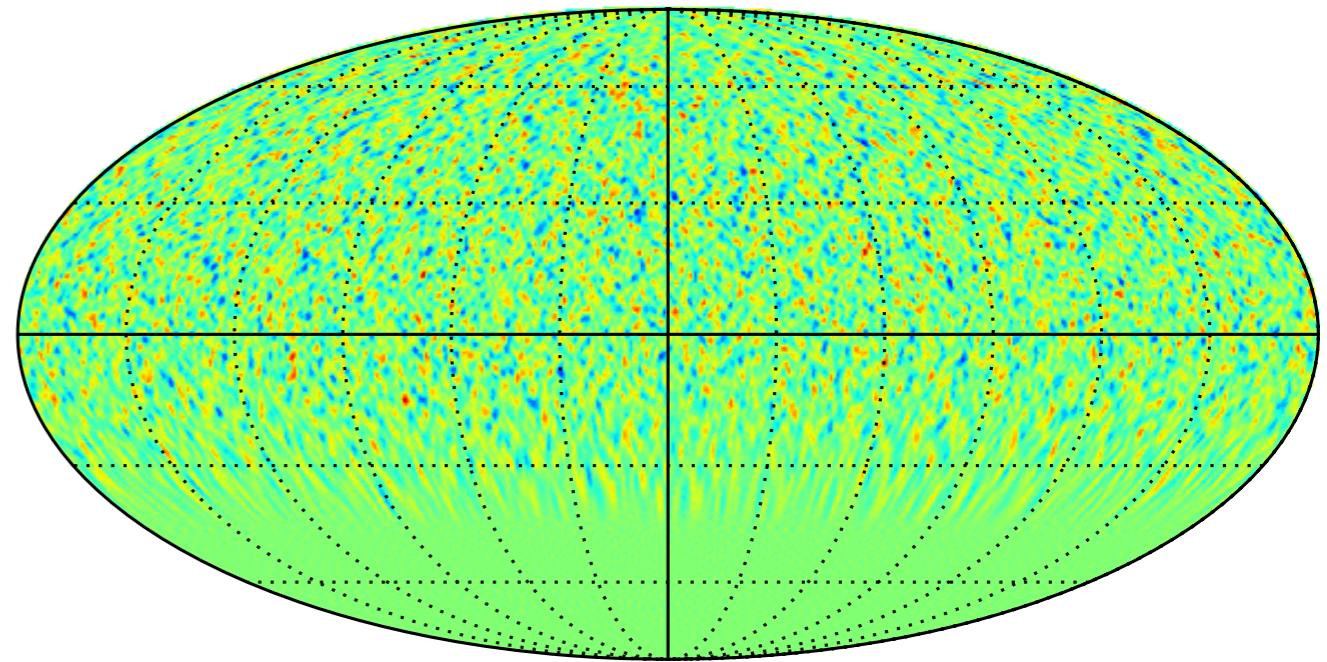
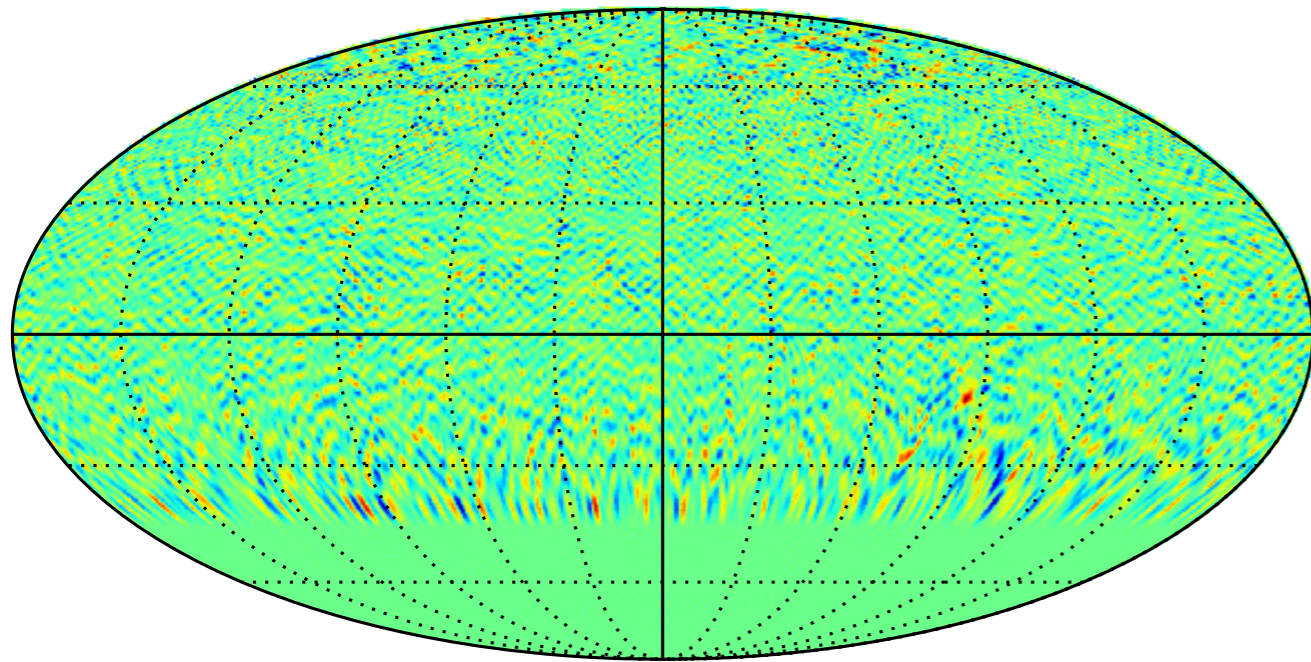
$\sim 5x$ dimmer

$S/F > 10$



$\sim 10x$ dimmer

$S/F > 100$



$\sim 70x$ dimmer

Summary

- Unconventional interferometers need unconventional data analysis:
 - ▶ m-mode transform is a promising method for analysing wide field interferometric data
 - ▶ Enable the use of Signal-to-Noise eigenmodes for foreground removal
 - ▶ Similar advantages for power spectrum estimation