Data Analysis for CHIME

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November 23, 2012



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Drift Scan Telescopes

- All intensity mapping experiments have a common set of analysis challenges:
 - Wide field at given instant
 - All sky as total surveyed area is large
 - Polarised analysis to address leakage
- Restrict to drift scan instruments
 - Signal is power from one antenna or correlation betweeb two.
 - Instantaneously signal is a linear combination of the Stokes parameters on the sky.
 - Transit instrument, no moving parts, time variation comes only from Earth rotation, plus noise.

Drift Scan Analysis

• Visibility is the instantaneous correlation $V_{ij} \propto \langle F_i F_j^* \rangle$. After including noise (n_{α}) and sky rotation (ϕ)

$$V_{ij}(\phi) = \int \left[B_{ij}^T(\hat{\boldsymbol{n}};\phi) T(\hat{\boldsymbol{n}}) + B_{ij}^Q(\hat{\boldsymbol{n}};\phi) Q(\hat{\boldsymbol{n}}) + B_{ij}^U(\hat{\boldsymbol{n}};\phi) U(\hat{\boldsymbol{n}}) \right] d^2 \hat{\boldsymbol{n}} + n_{ij}(\phi) \quad (1)$$

and the transfer function is

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

Signal is periodic in ϕ — fourier transform. Using spherical transform, and map $Q, U \rightarrow E, B$

$$V_{ij;m} = \sum_{l} \left[B_{ij;lm}^{T} a_{lm}^{T} + B_{ij;lm}^{E} a_{lm}^{E} + B_{ij;lm}^{B} a_{lm}^{B} \right] + n_{ij;m} .$$
(3)

m-transform

- Observing process does not mix *m*-modes on the sky. *V_m* uncorrelated for stationary noise.
- Write as vector equation for each m

$$\boldsymbol{v} = \mathbf{B} \, \boldsymbol{a} + \boldsymbol{n} \, . \tag{4}$$

- Dramatically reduces correlated degrees of freedom. *Huge computational saving*.
- Expresses problem in a language we understand. *Linear signal processing*. (e.g. imaging = inversion)
- Gives an alternative way of analysing interferometers.
 - Naturally treats all wide-field effects.
 - Polarisation is fully treated from the start.

- Coping with polarisation leakage will always require knowing the full polarised response of every antenna.
- How do we measure this? *Pulsar holography*
 - Cross correlate every feed with an external antenna tracking a source as it drifts through the beams.
 - Pulsar gating (subtract off from on), removes confusion limitations.
 - Directly measures electric field response at pulsar location.
- Also require high stability of system (> 30 dB). Use *rigidization* to achieve this.
 - Inject a known, common, stable noise source.
 - Cross correlate with each to determine complex gain fluctuations.

Foreground Removal

Spectral smoothness allows separation of 21cm. Options:

- 1 Fit power law to maps
- 2 Remove low order polynomials
- 3 Measure components and model (Liu and Tegmark)
- 4 FastICA (Chapman et al., for EoR)

Most methods have difficulties:

Mode mixing of angular and frequency fluctuations by frequency-dependent beams (esp. interferometers) [1, 2]
Robustness Biasing introduced if foreground model poorly understood (esp. non-gaussianities). [1, 3]
Statistical Optimality Need to keep track of transformations on statistics, for optimal PS estimation [1, 2]

Signal-to-Noise Eigenmodes

Construct the covariances of the signal and foregrounds

$$\mathbf{S} = \mathbf{B} \left\langle \boldsymbol{a}_s \boldsymbol{a}_s^{\dagger} \right\rangle \mathbf{B}^{\dagger}, \qquad \mathbf{F} = \mathbf{B} \left\langle \boldsymbol{a}_f \boldsymbol{a}_f^{\dagger} \right\rangle \mathbf{B}^{\dagger}$$
(5)

Jointly diagonalise both matrices (eigenvalue problem)

$$\mathbf{S}\boldsymbol{x} = \lambda \mathbf{F}\boldsymbol{x} \tag{6}$$

Gives a new, uncorrelated, basis. Eigenvalue λ_i gives ratio of signal to foreground variance for mode *i*.

- Foreground removal is performed by projecting out modes with low signal-to-foreground ratio.
- Addresses the previous problems
 - Analysis uses all measured data to avoid *mode mixing*.
 - Can be made arbitrarily *robust*, by increasing threshold.
 - Linear transform on data, keeps track of *statistics*

Conclusions

- Instruments like CHIME are a very different class of interferometers, require completely different analysis technique.
- *m*-mode decomposition reduces entire analysis to linear signal processing, naturally treats effects that are traditionally very difficult: wide-field imaging, polarisation leakage.
- Computational efficiency allows 'optimal' foreground removal and power spectrum estimation.
- Requirements are strict:
 Time stability by rigidization
 Polarisation response by pulsar holography

Signal/Foreground Spectrum



Sky simulation



 $\sim 10^6 \times {\rm brighter}$

Beam Projected



 $\sim 10^6 \times {\rm brighter}$



\sim same brightness



$\sim 3 \times {\rm dimmer}$



$\sim 5\times$ dimmer



$\sim 10\times$ dimmer

S/N > 100



$\sim 70 \times$ dimmer