



UNIVERSITY OF  
**OXFORD**

# The challenges of HI intensity mapping

David Alonso – Oxford Astrophysics  
with P. Ferreira, M. Santos, P. Bull  
ArXiv:1405.1751, 1409.????

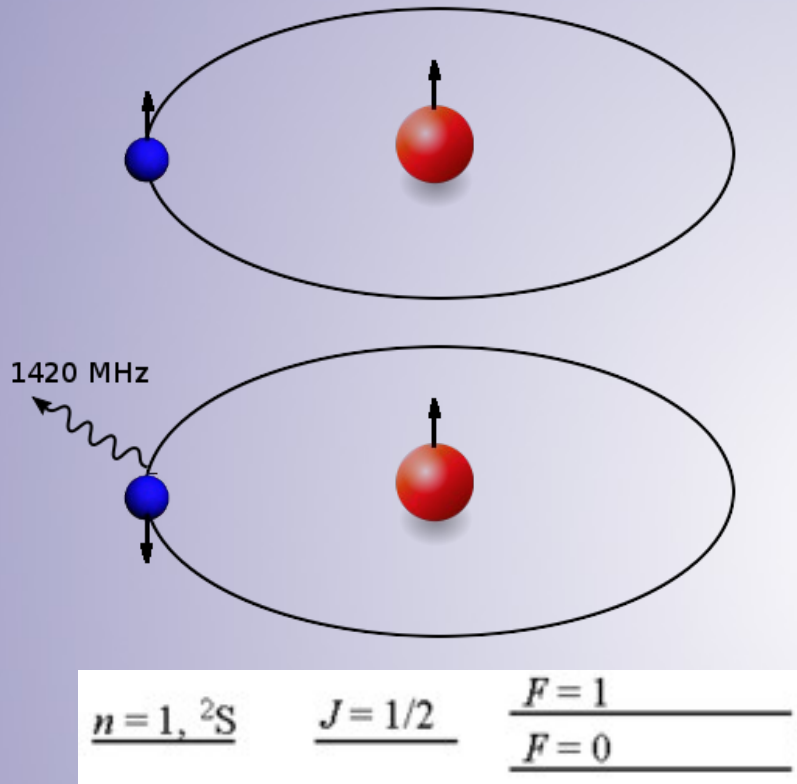
Benasque – 13 August 2014



# Outline

- **Intensity mapping**
  - The signal
  - Observational techniques
- **Foregrounds**
  - Galactic synchrotron
  - Extragalactic foregrounds
  - Simulations
- **Blind foreground subtraction**
  - Blind cleaning methods: a unified picture
  - Results
  - When does it break down?
- **Summary**

# The 21cm signal



- Hyperfine transition

- Strongly forbidden

$$t_{1/2} \simeq A_{01}^{-1} = 1.11 \times 10^7 \text{ y}$$

- A 3D tracer of neutral hydrogen

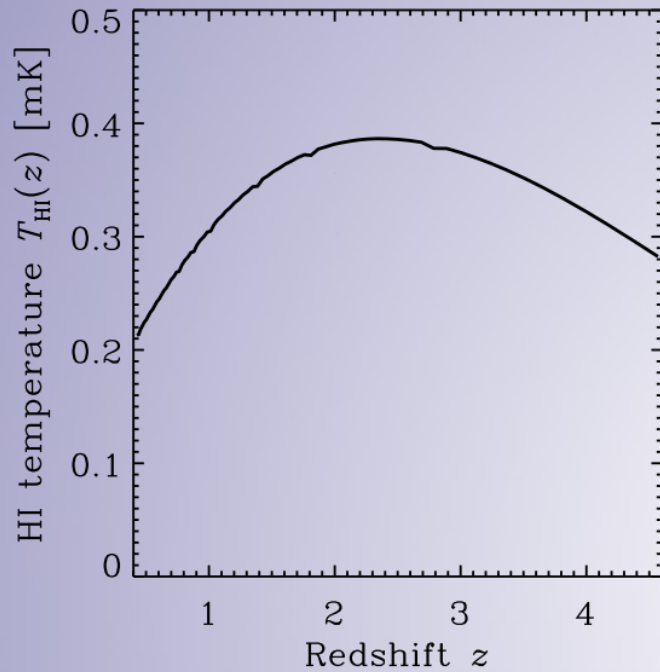
$$\nu = \frac{\nu_{21}}{1+z}$$

$$dL = \frac{3}{4} A_{10} h \nu_{21} n_{\text{HI}} \phi(\nu) d\nu dA dr$$

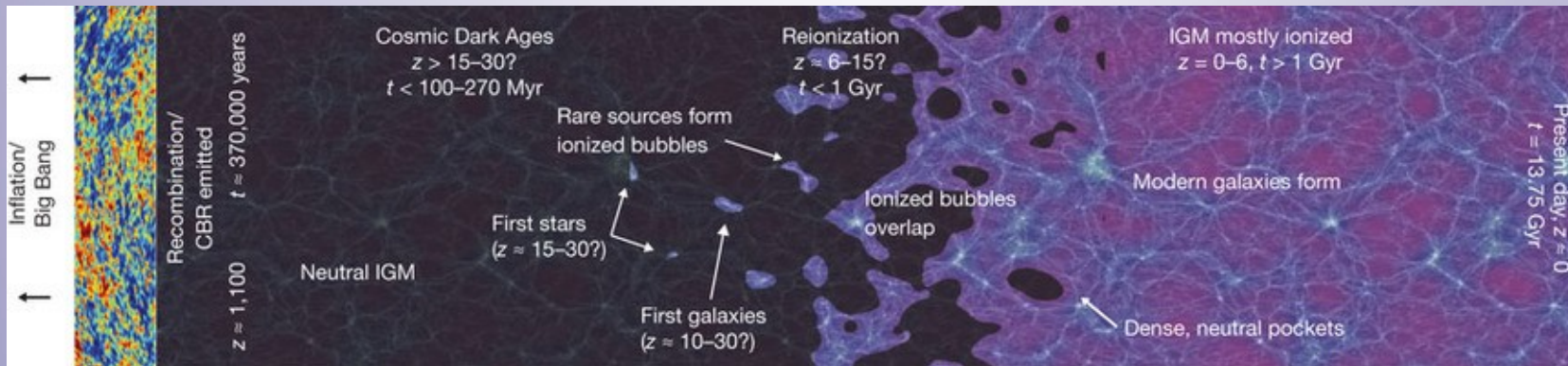
$$T_{21}(z, \hat{n}) = (0.19055 \text{ K}) \frac{\Omega_b h (1+z)^2 x_{\text{HI}}(z)}{\sqrt{\Omega_M (1+z)^3 + \Omega_\Lambda}} (1 + \delta_{\text{HI}})$$

Review: Furlanetto, Oh & Briggs, 2006

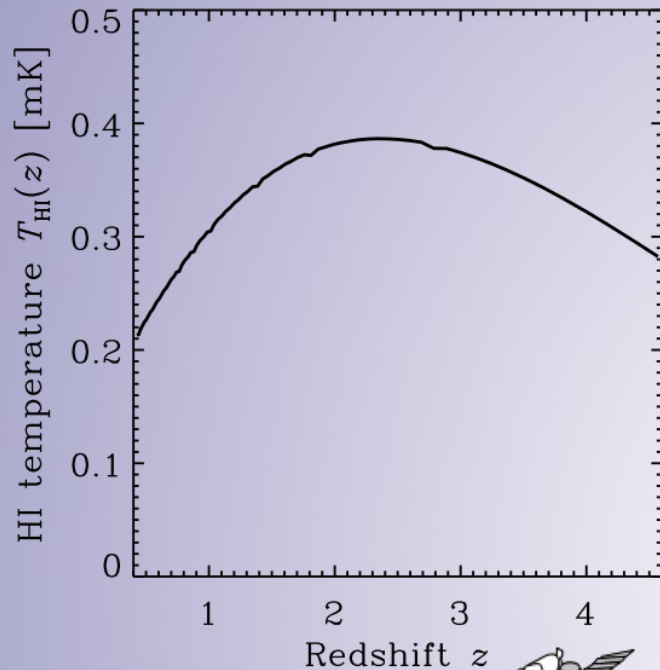
# Neutral hydrogen in the Universe



- 21cm is ideal to study the physics of the EoR and the Dark Ages.
- At late times the Universe is ionized. HI inside galaxies (DLAs).



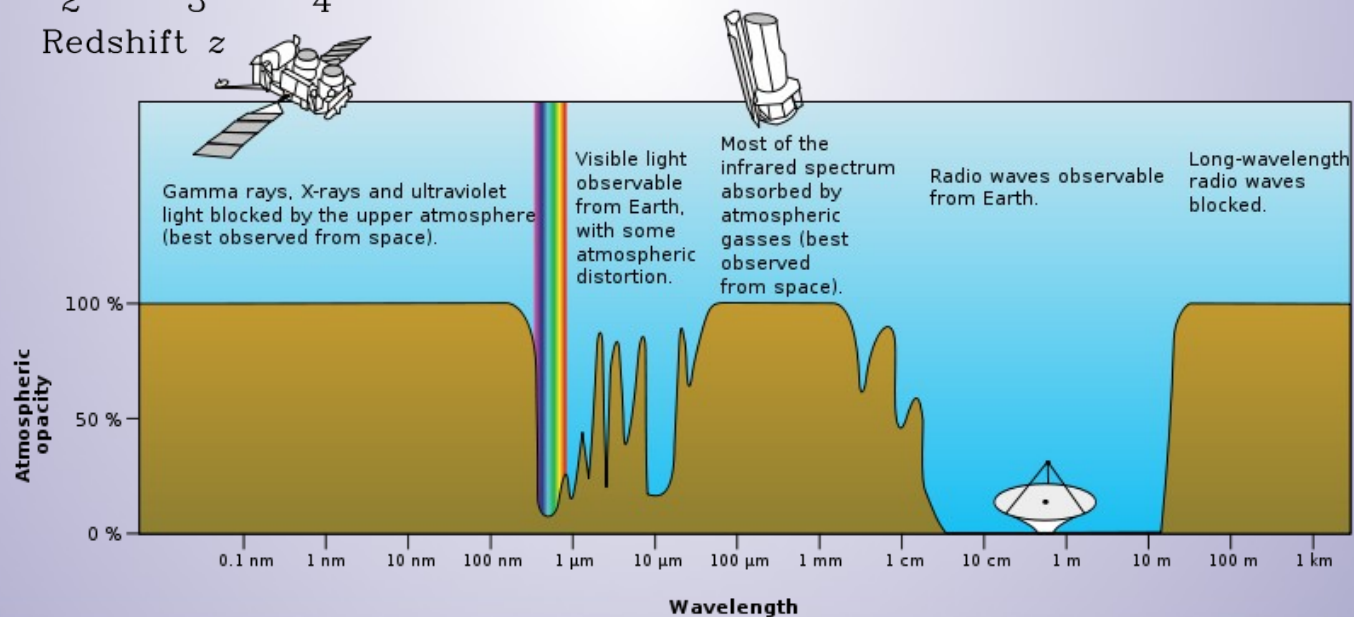
# Neutral hydrogen in the Universe



- 21cm is ideal to study the physics of the EoR and the Dark Ages.
- At late times the Universe is ionized. HI inside galaxies (DLAs).

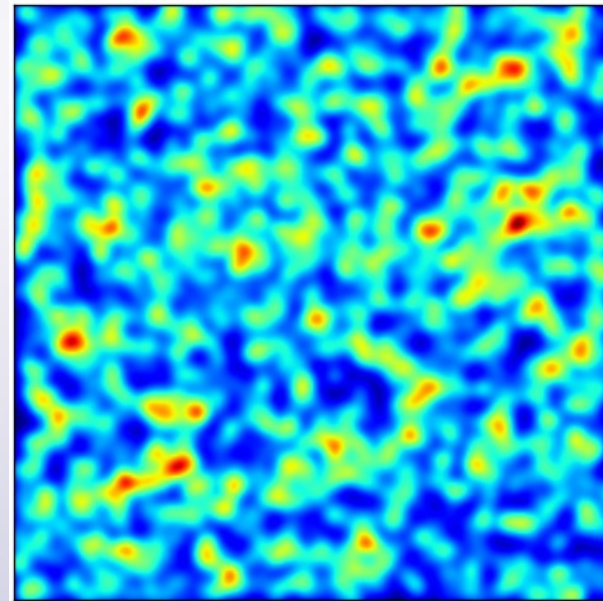
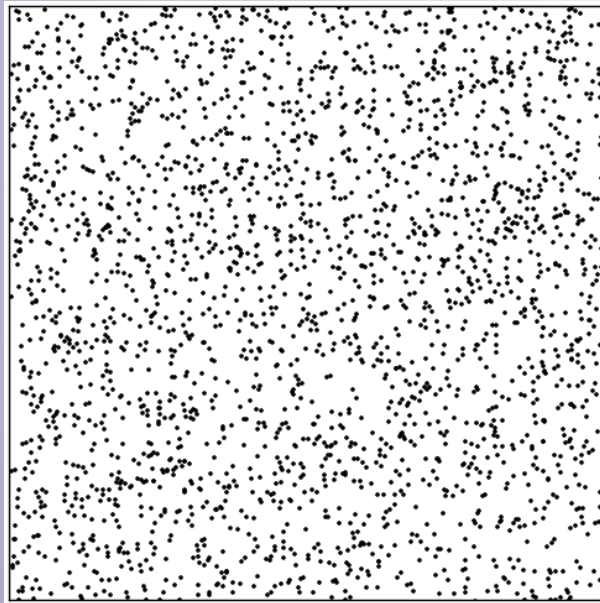
- ✓ Spectrally isolated
- ✓ Small obscuration
- ✓ Signal grows with  $z$

- ✗ Difficult to observe many individual objects  
→ Intensity mapping



# Intensity mapping

- Large pixels: joint emission from multiple galaxies instead of resolving them.
- We only care about large scales
- “Cheap” way to observe large volumes



# Intensity mapping

- Large pixels: joint emission from multiple galaxies instead of resolving them.
- We only care about large scales
- “Cheap” way to observe large volumes
- Interferometers vs. single dish

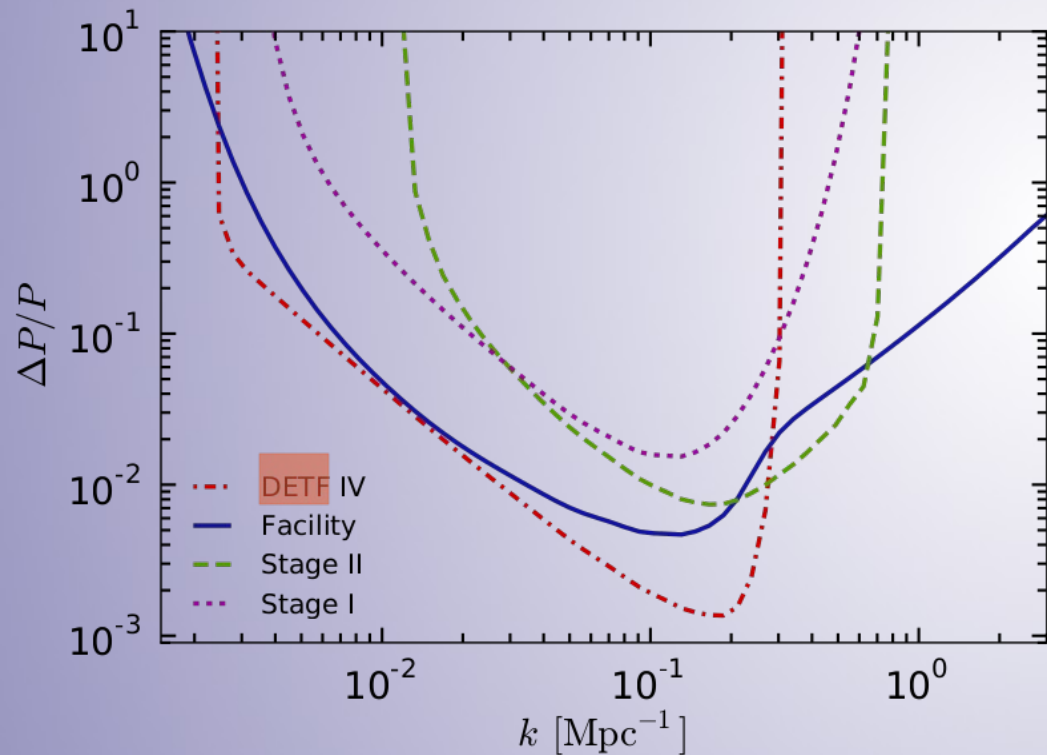
$$\frac{\lambda}{b_{\max}} < \Delta\theta < \frac{\lambda}{b_{\min}}$$
$$\frac{\lambda}{D_{\text{dish}}} < \Delta\theta$$

Bull et al. 2014

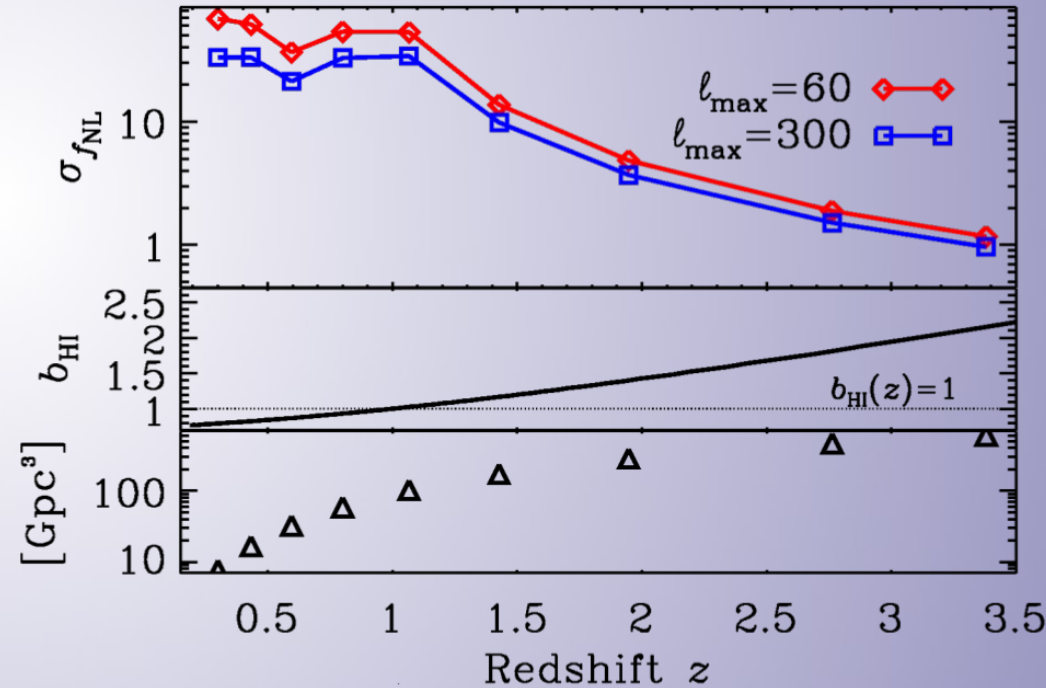


# Intensity mapping

- Forecasts: constraining power competitive with largest redshift surveys.
- Main science goals: BAO, RSD, ultra-large scales



Bull et al. 2014



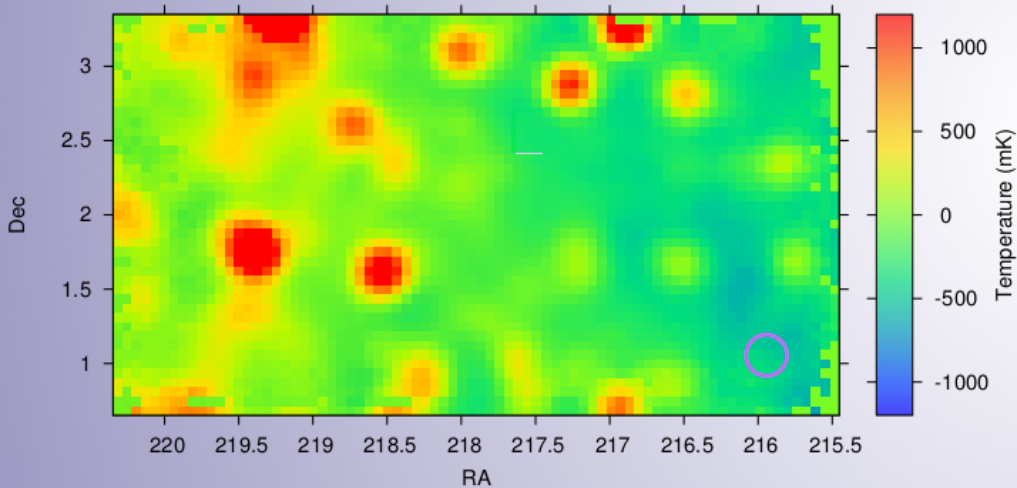
Camera et al. 2013



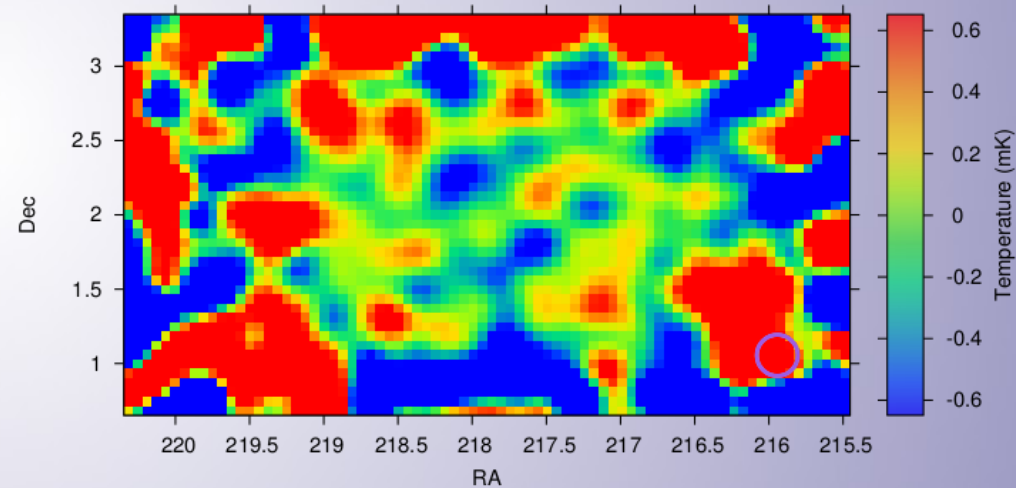
# Intensity mapping

- Forecasts: constraining power competitive with largest redshift surveys.
- Main science goals: BAO, RSD, ultra-large scales
- First measurements have already taken place. Main challenge: foregrounds.

GBT 15hr field (800.4 MHz,  $z = 0.775$ )



GBT 15hr field, cleaned, beam convolved (800.4 MHz,  $z = 0.775$ )



Masui et al. 2013  
Switzer et al. 2013

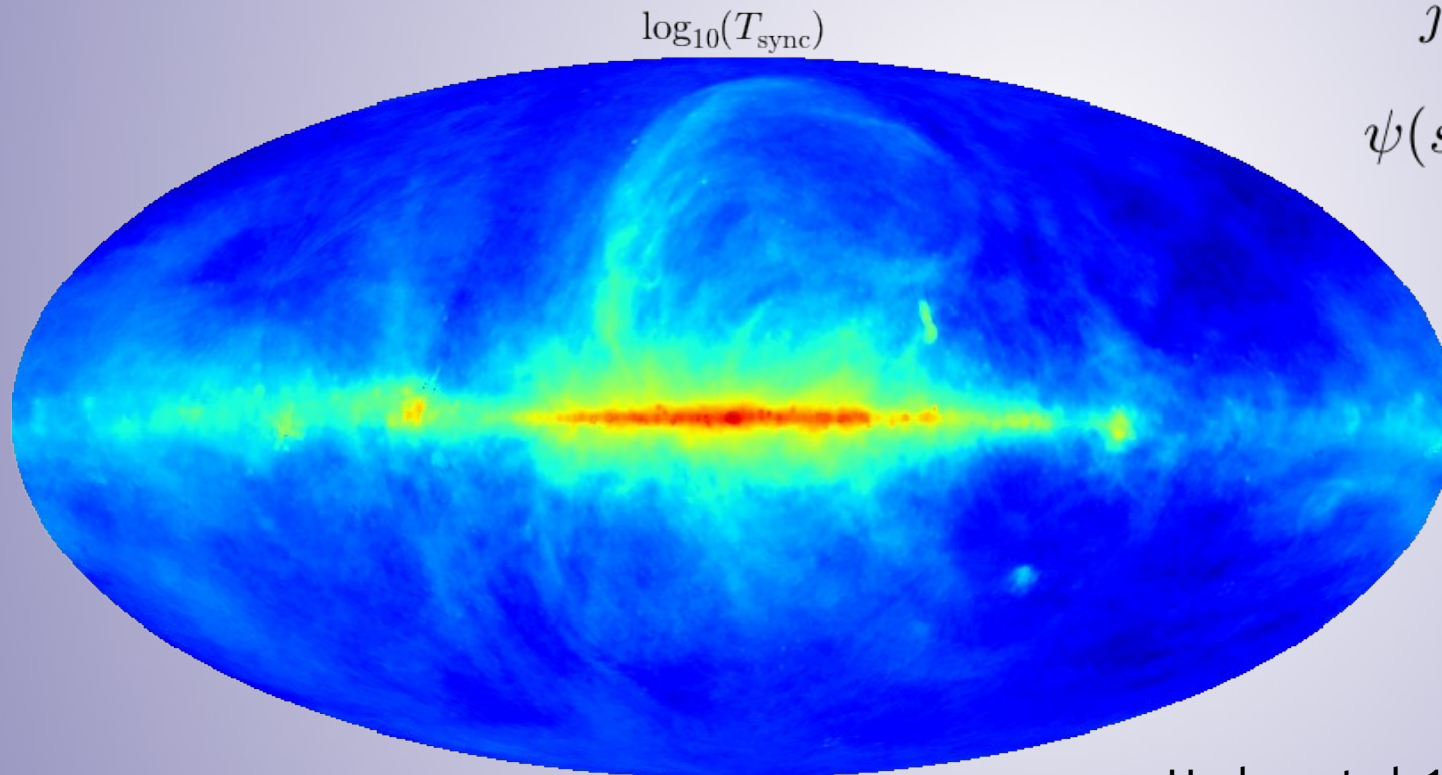
# Radio foregrounds

Galactic synchrotron

$$I_P = \int ds j(s, \hat{\mathbf{n}}, \nu) \exp 2i [\phi_0 + \psi(s, \hat{\mathbf{n}})/\nu^2]$$

$$j(s, \hat{\mathbf{n}}, \nu) \propto n_{\text{CR}} B_{\perp} \nu^{\alpha}$$

$$\psi(s, \hat{\mathbf{n}}) \propto \int_0^s n_e B_{\parallel} ds'$$



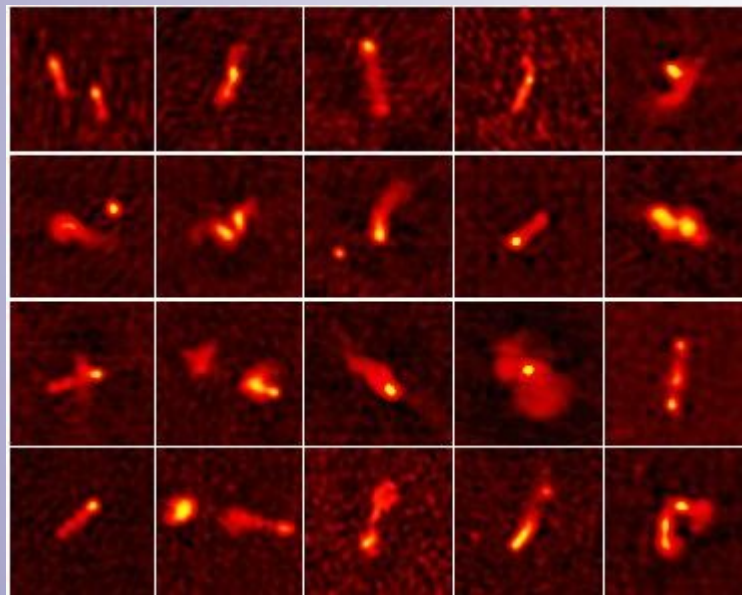
Haslam et al. 1982



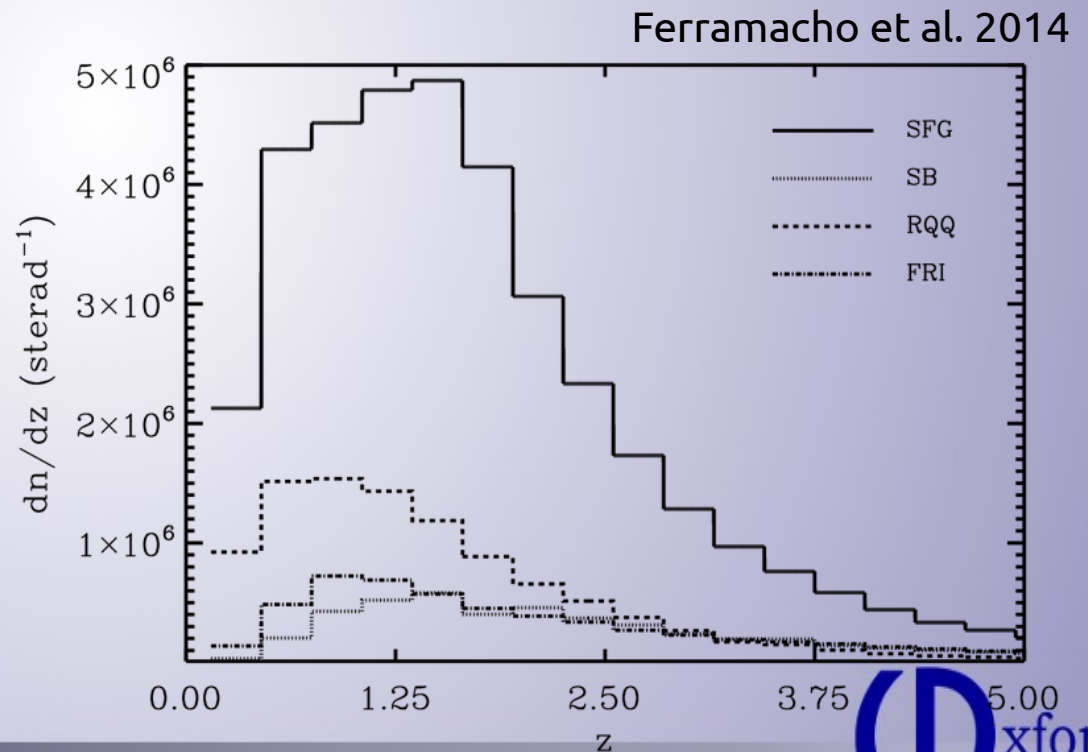
# Radio foregrounds

## Extragalactic foregrounds

- Point sources: radio galaxies (star-forming galaxies, AGNs...)
- Free-free emission
- For IM may actually be “behind” the signal!
- Extragalactic sources could be potentially correlated with the signal!

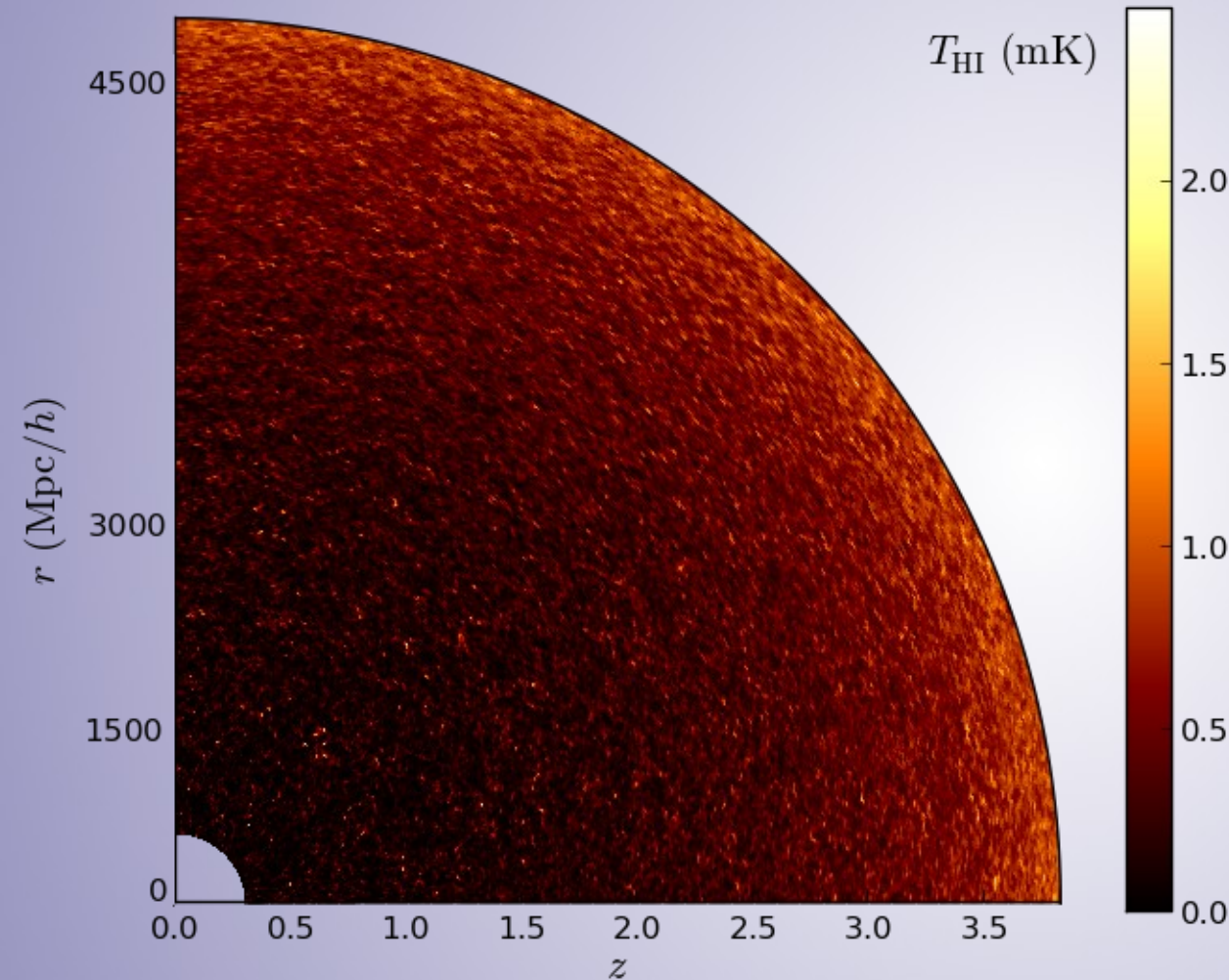


Source: nrao.edu



# Intensity mapping simulations

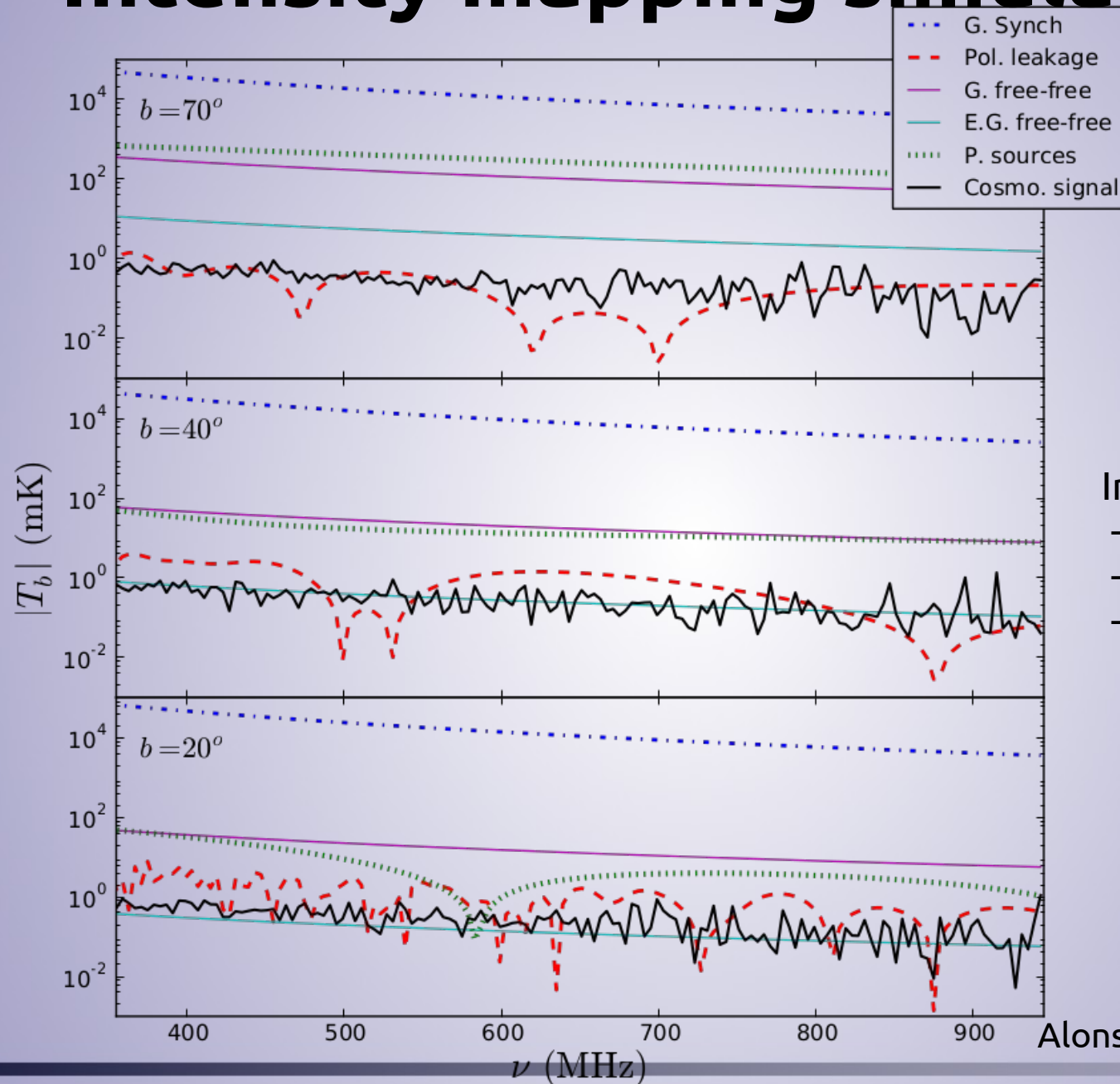
The cosmological signal



- (1) Generate lognormal density and radial velocities.
- (2) Compute 3D HI mass grid.
- (3) Interpolate to pixel maps and implement RSDs.

Alonso et al. 2013

# Intensity mapping simulations



Instrumental effects:  
- Beam convolution  
- Polarization leakage  
- Noise

Alonso et al. 2013

# Blind foreground subtraction

- Blind methods: minimize assumptions about foregrounds → foregrounds are  $\nu$ -smooth
- Blind source equation

$$T(\nu, \theta) = \sum_{k=1}^{N_{\text{fg}}} f_k(\nu) S_k(\theta) + T_{\text{cosmo}}(\nu, \theta) + T_{\text{noise}}(\nu, \theta)$$

$$x_i = T(\nu_i, \theta) \quad A_{ik} = f_k(\nu_i) \quad s_k = S_k(\theta)$$

$$\mathbf{x} = \hat{\mathbf{A}} \cdot \mathbf{s} + \mathbf{n},$$

- 3 different methods:
  - **LOS fitting**: choose ad-hoc smooth functions.  
Usually polynomial fitting in log-log space.
  - **PCA**: *uncorrelated* sources maximizing the variance.  
Diagonalize  $\nu$ -covariance and subtract principal eigenvectors.
  - **ICA**: *independent* sources maximizing the variance.  
Find independent sources by maximizing non-Gaussianity (CLT).  
(See Wolz et al. 2013 for a first application to IM).  
Equivalent to PCA for Gaussian foregrounds.
- Aim: agnostic comparison of all these methods

# Blind foreground subtraction

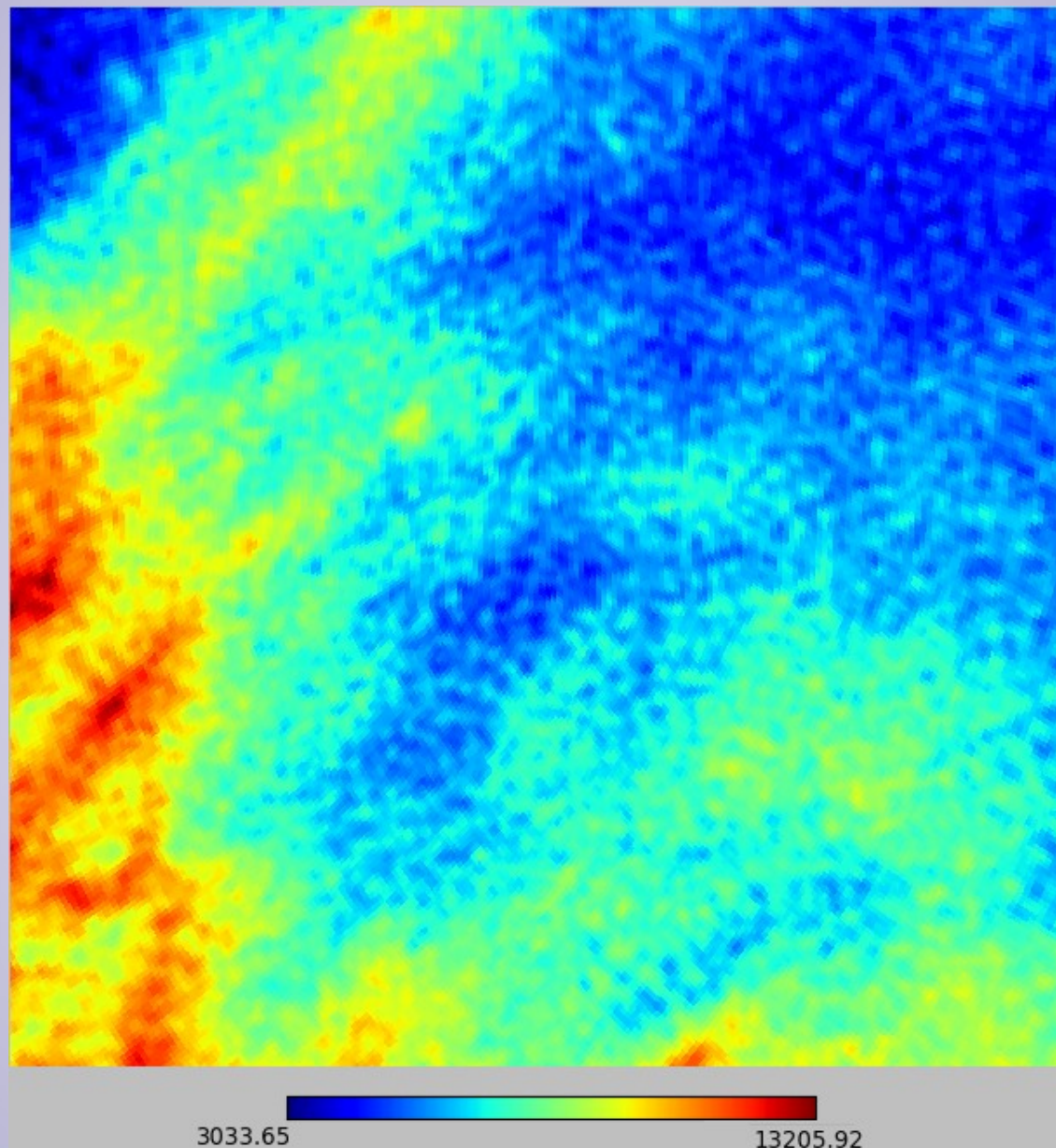
- We define 2 figures-of-merit for foreground subtraction:

$$\eta \equiv \frac{\langle P_{\text{clean}} - P_{\text{cosmo}} \rangle}{\sigma_P} \qquad \rho \equiv \frac{\langle P_{\text{res}} \rangle}{\sigma_P}$$

- $\eta$ : bias in the power spectrum.  $\rho$ : signal loss.
- Must be evaluated both in the angular and radial power spectra.
- Studied cleaning efficiency by averaging over 100 independent simulations. SKA-mid parameters ( $D_{\text{dish}}=15\text{m}$ ,  $N_{\text{dish}}=254$ ,  $t=10\text{K h}$ ,  $T_{\text{sys}}=25\text{K}$ ). No polarization leakage.

# Blind foreground subtraction

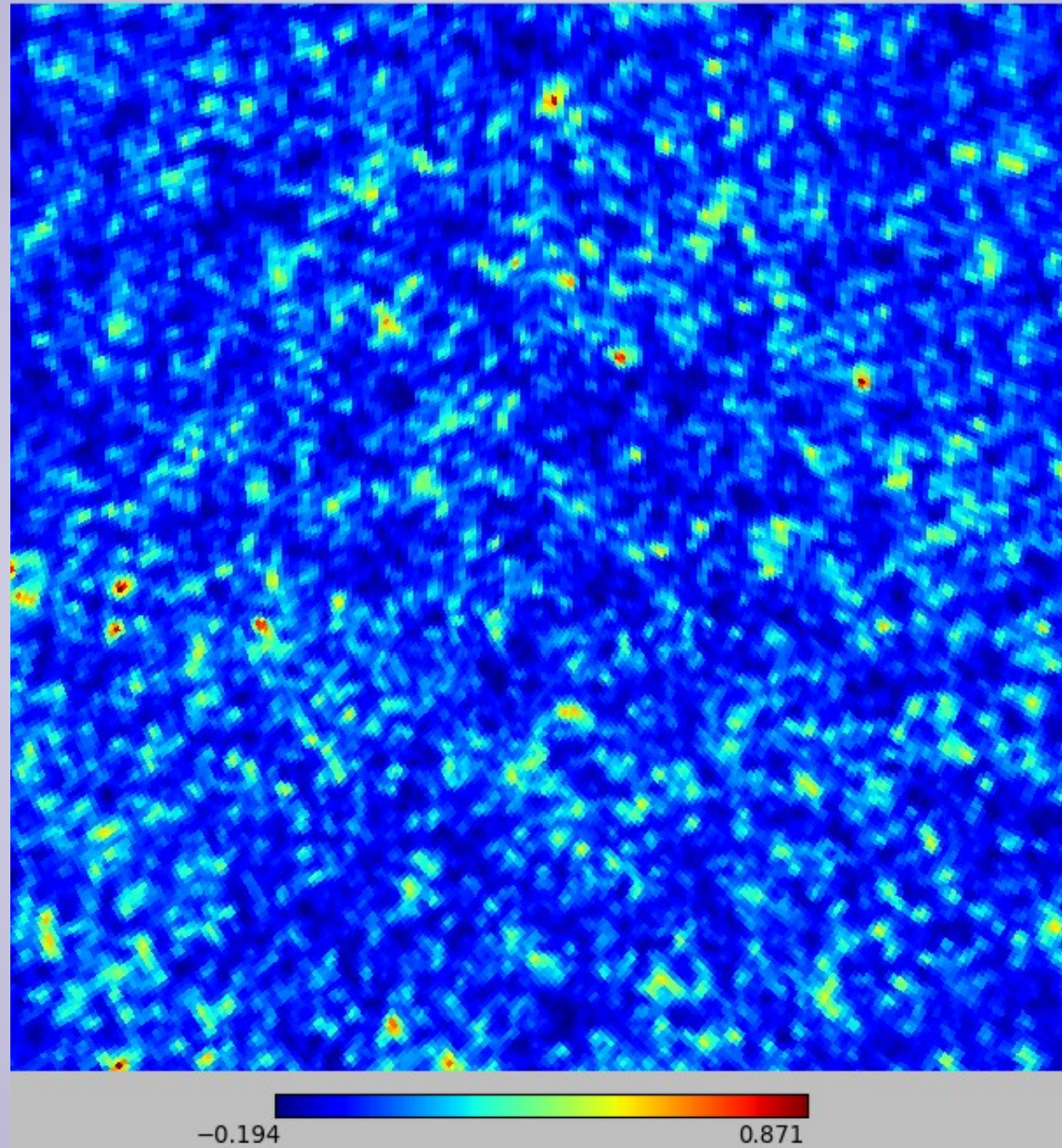
Signal+FG





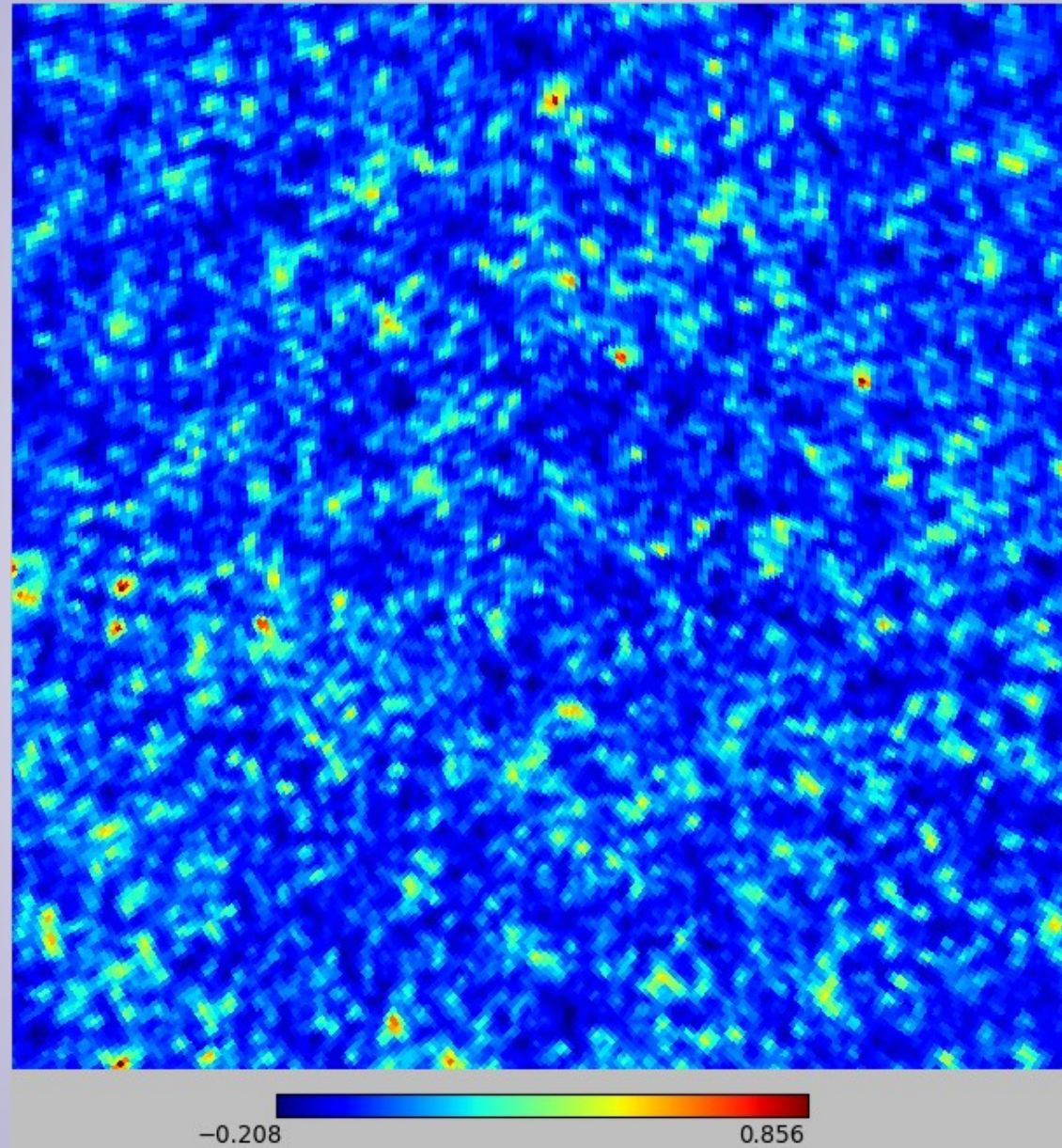
# Blind foreground subtraction

Signal only

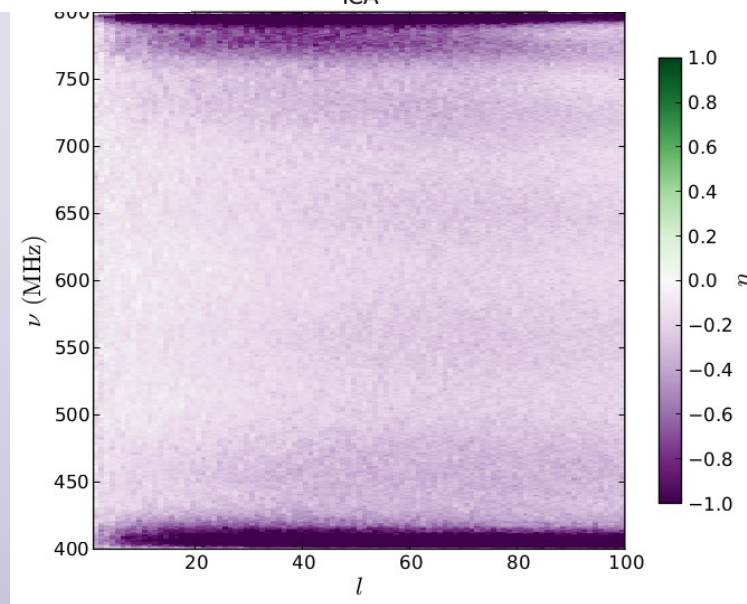
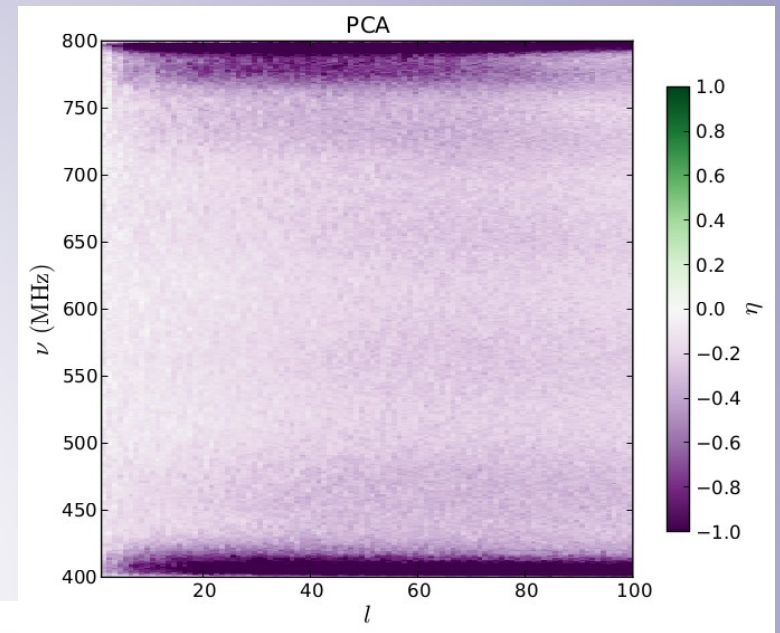
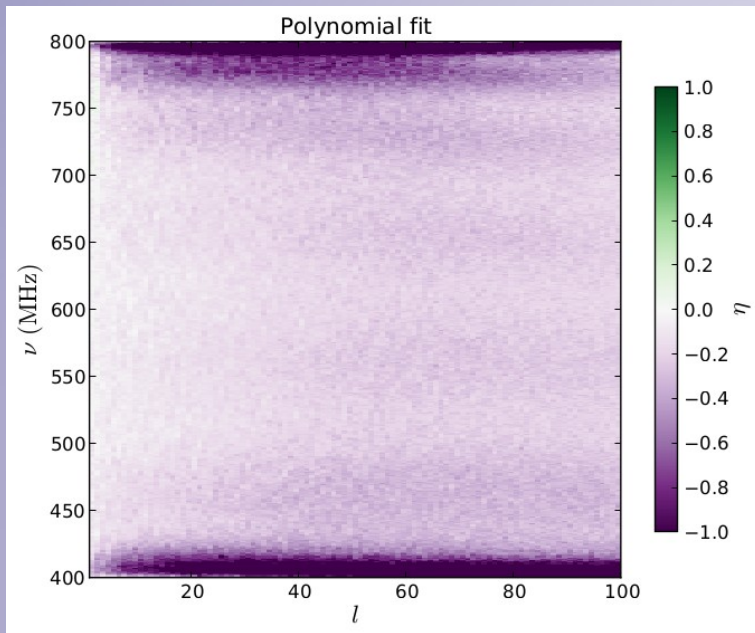


# Blind foreground subtraction

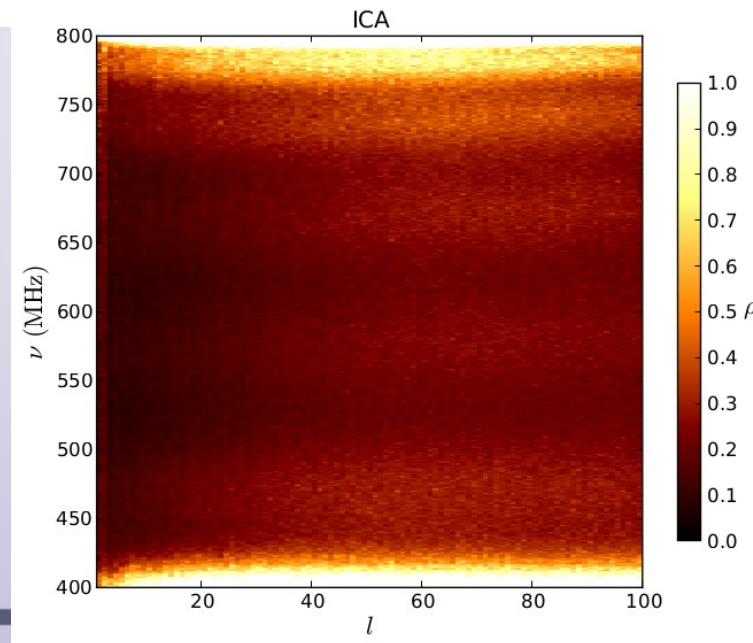
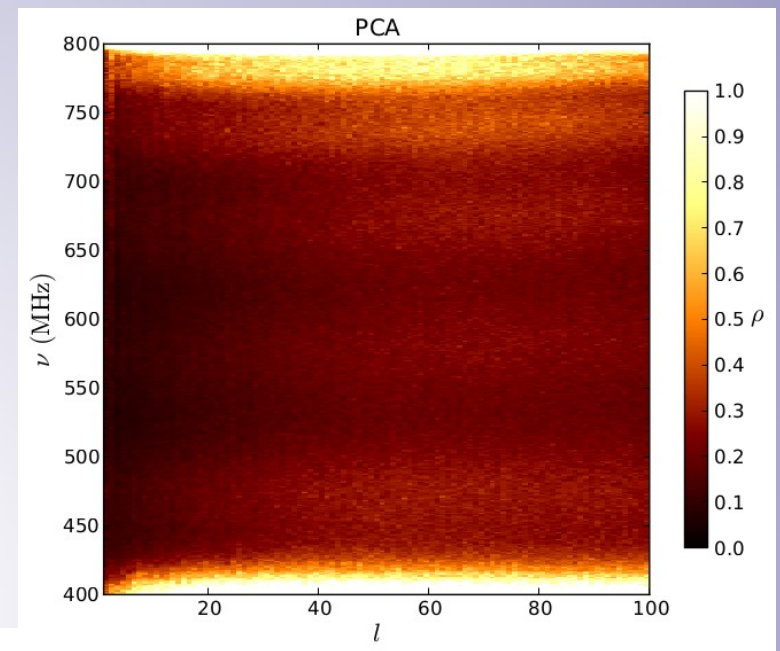
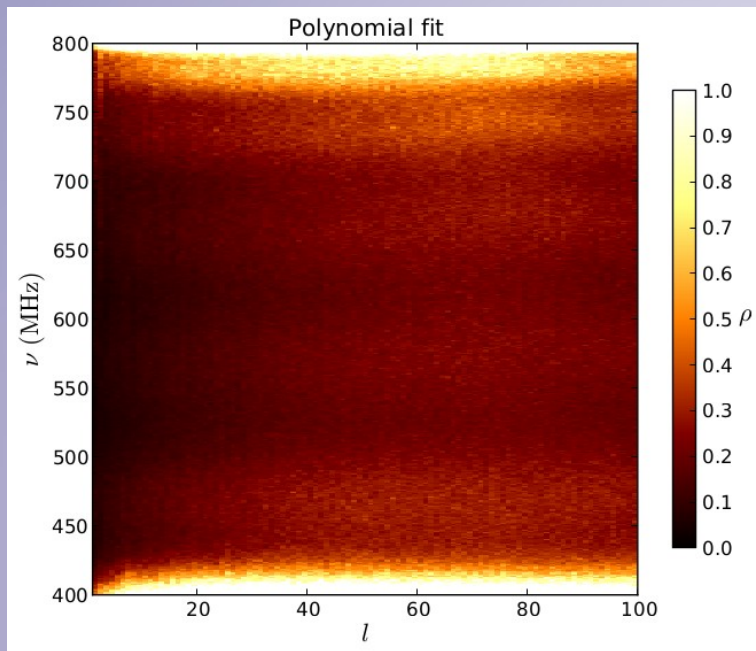
Cleaned map



# Blind foreground subtraction



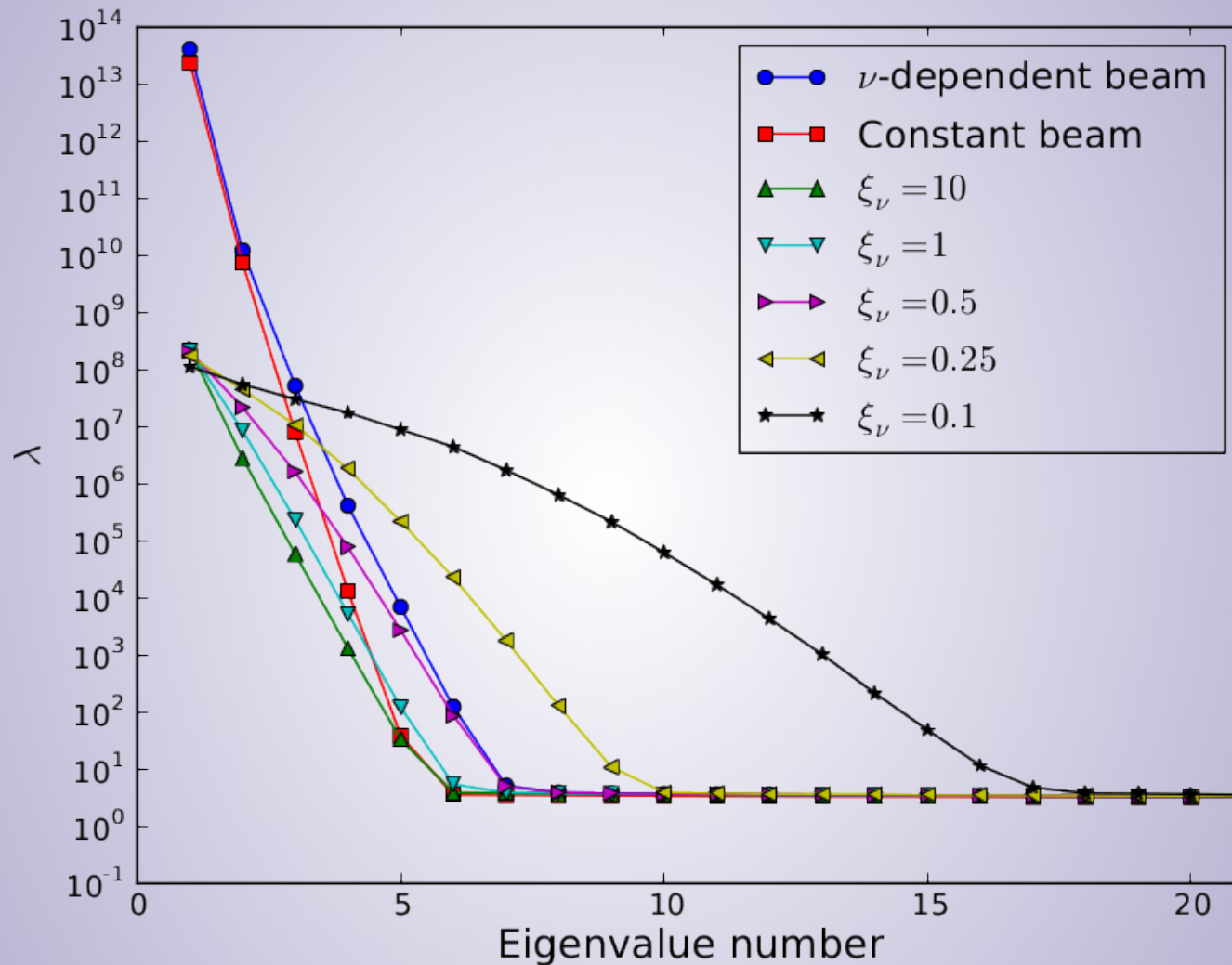
# Blind foreground subtraction



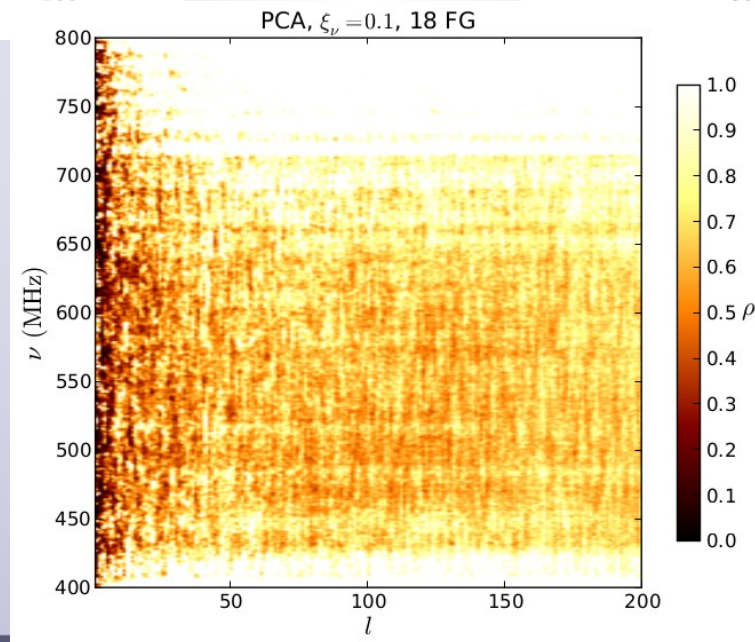
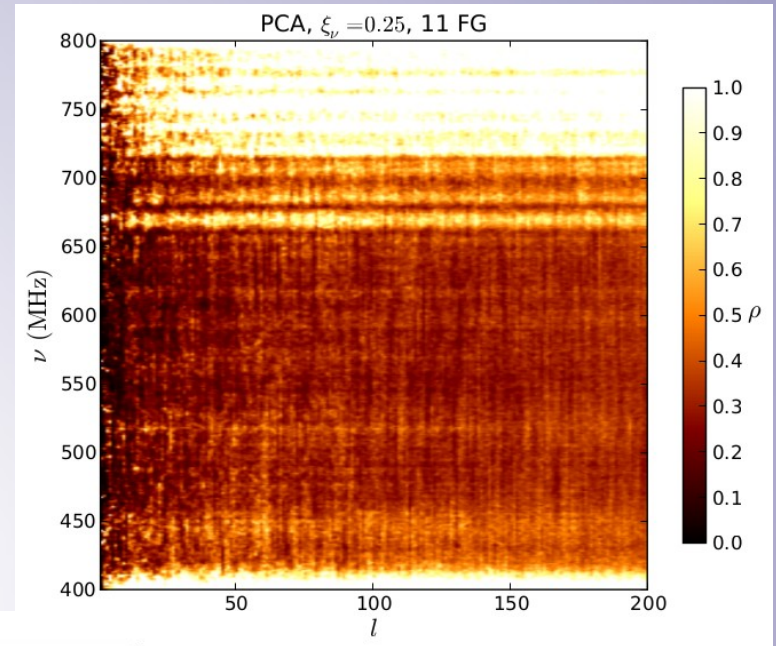
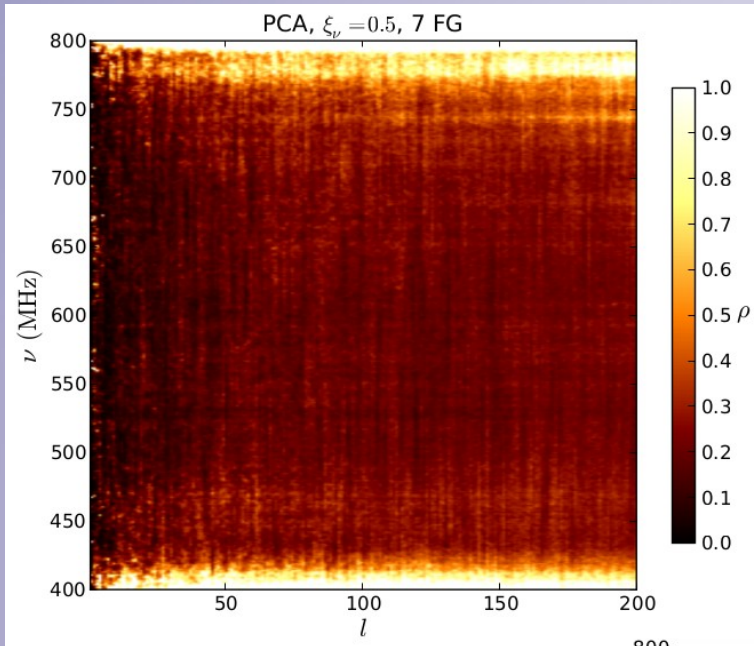
Equivalent results!

# Blind foreground subtraction

When does it break down?



# Blind foreground subtraction



# Conclusions

- Intensity mapping is a potentially powerful cosmological probe.
- Computational challenges: fast simulations to study errors, systematics, model independence...
- Observational challenges: huge ( $10^5$ ) galactic and extragalactic foregrounds.
- Blind foreground subtraction: simplest but efficient methods.
- Formally equivalent, but also similar in practice.
- Foregrounds must be smooth (and they are).
- Instrumental effects (beam, polarization leakage) may be a lot more important.

# Conclusions

- Intensity mapping is a potentially powerful cosmological probe.
- Computational challenges: fast simulations to study errors, systematics, model independence...
- Observational challenges: huge ( $10^5$ ) galactic and extragalactic foregrounds.
- Blind foreground subtraction: simplest but efficient methods.
- Formally equivalent, but also similar in practice.
- Foregrounds must be smooth (and they are).
- Instrumental effects (beam, polarization leakage) may be a lot more important.

**¡Muchas gracias!**

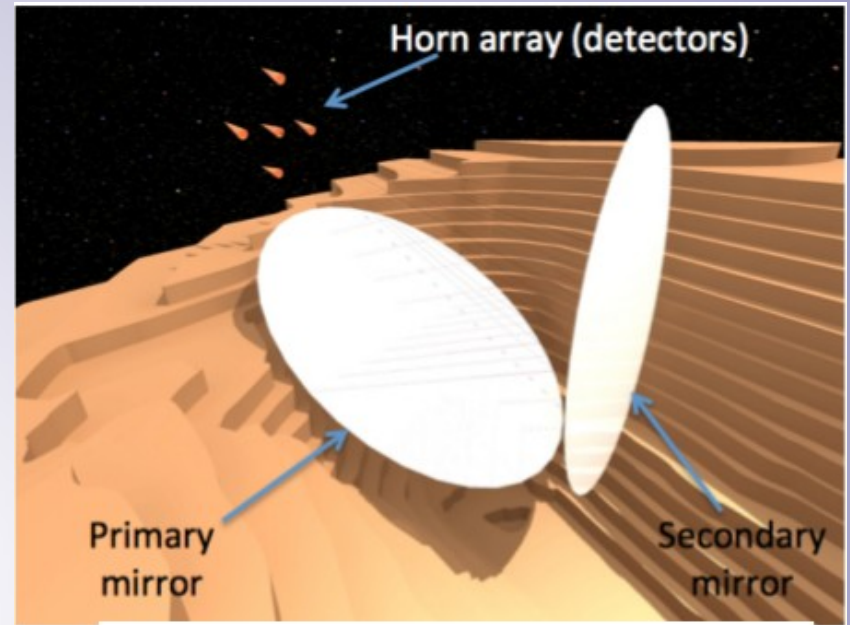


# Intensity mapping

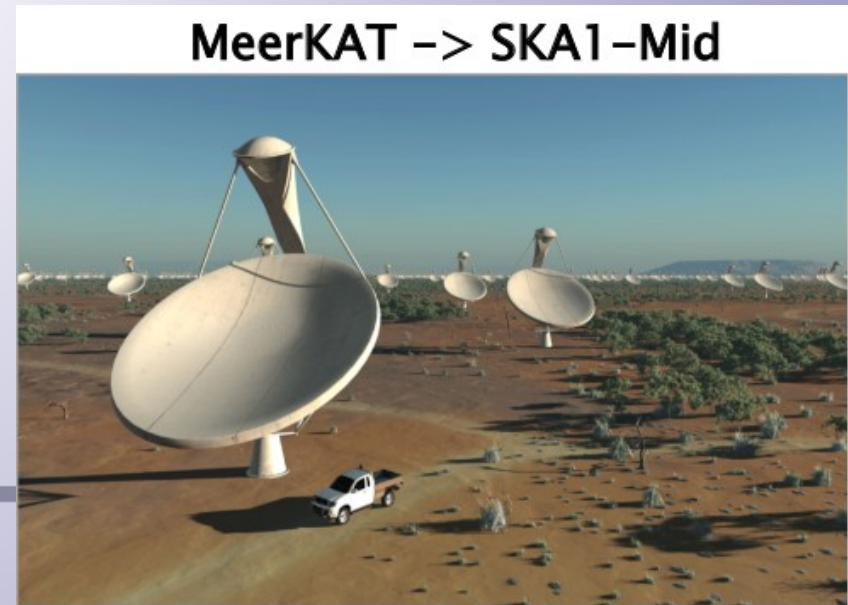
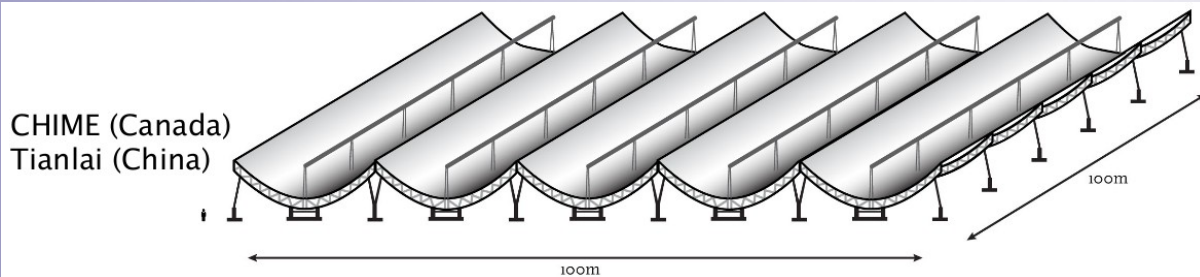
## Overview of experiments



- GBT (Chang et al.)



BINGO (Battye, et al. 1209.1041)



# Radio foregrounds

## Extragalactic foregrounds

- Point sources: radio galaxies (star-forming galaxies, AGNs...)
- Free-free emission
- For IM may actually be “behind” the signal!
- Extragalactic sources could be potentially correlated with the signal!

## Other foregrounds

- Line foregrounds. The only candidates for line confusion are very faint!

### IAU list of important spectral lines

| Substance             | Rest Frequency | Suggested minimum bandwidth |
|-----------------------|----------------|-----------------------------|
| Deuterium (DI)        | 327.384 MHz    | 327.0 - 327.7 MHz           |
| Hydrogen (HI)         | 1420.406 MHz   | 1370.0 - 1427.0 MHz         |
| Hydroxyl radical (OH) | 1612.231 MHz   | 1606.8 - 1722.2 MHz         |
| Methylidyne (CH)      | 3335.481 MHz   | 3324.4 - 3338.8 MHz         |

Source: craf.eu

# Intensity mapping simulations

## Foregrounds: extragalactic foregrounds

- Foreground contamination modeled as a Gaussian random field, based on the SCK 05 model.
- The correlation length  $\xi$  will determine the efficiency of foreground cleaning.

| Foreground              | A (mK <sup>2</sup> ) | $\beta$ | $\alpha$ | $\xi$ |
|-------------------------|----------------------|---------|----------|-------|
| Galactic synchrotron    | 700                  | 2.4     | 2.80     | 4.0   |
| Point sources           | 57                   | 1.1     | 2.07     | 1.0   |
| Galactic free-free      | 0.088                | 3.0     | 2.15     | 35    |
| Extragalactic free-free | 0.014                | 1.0     | 2.10     | 35    |

$$C_l(\nu_1, \nu_2) = A \left( \frac{l_{\text{ref}}}{l} \right)^\beta \left( \frac{\nu_{\text{ref}}^2}{\nu_1 \nu_2} \right)^\alpha \exp \left( -\frac{\log^2(\nu_1/\nu_2)}{2 \xi^2} \right)$$

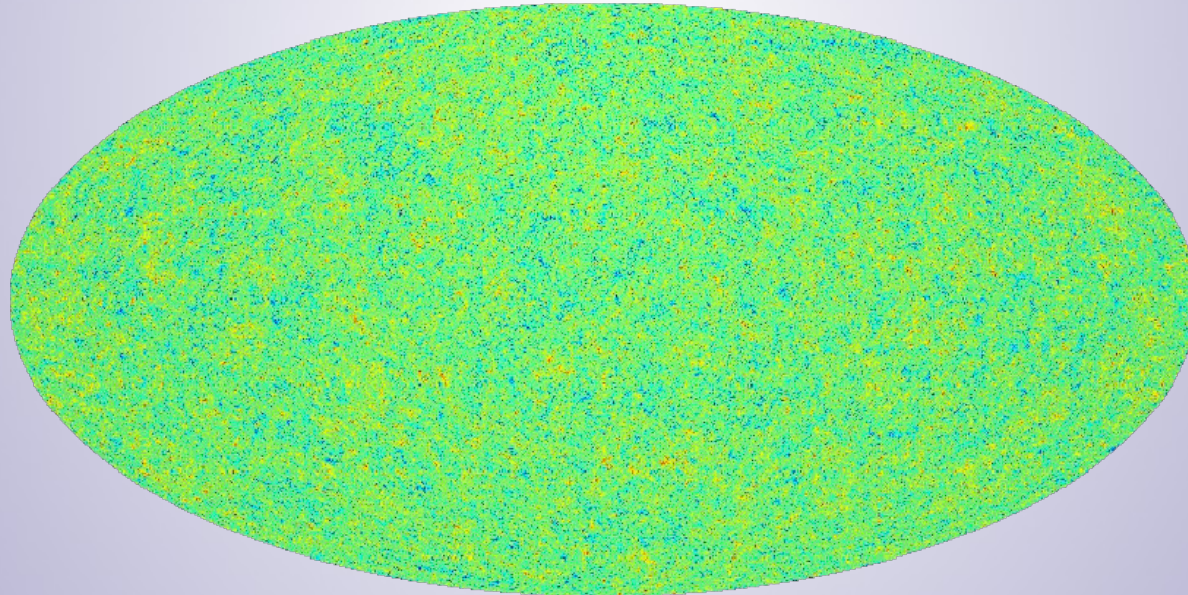
Santos, Cooray, Knox 2005

Alonso et al. 2013

# Intensity mapping simulations

## Foregrounds: extragalactic foregrounds

- Foreground contamination modeled as a Gaussian random field, based on the SCK 05 model.
- The correlation length  $\xi$  will determine the efficiency of foreground cleaning.
- Dominates contamination on small scales.

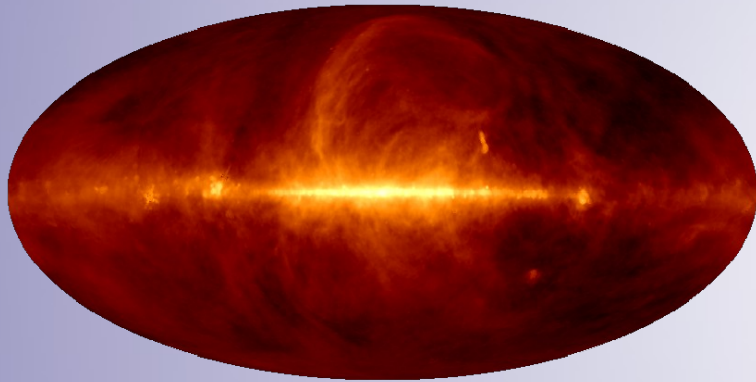


Alonso et al. 2013

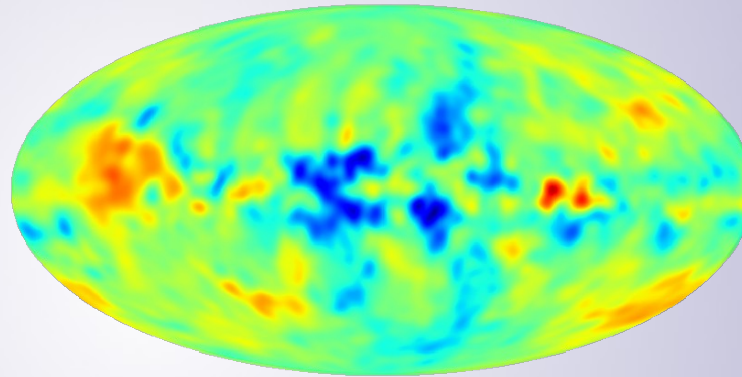
# Intensity mapping simulations

Foregrounds: synchrotron

Haslam et al. 1982



Delabrouille et al. 2013 (PSM)



+

+ SCK

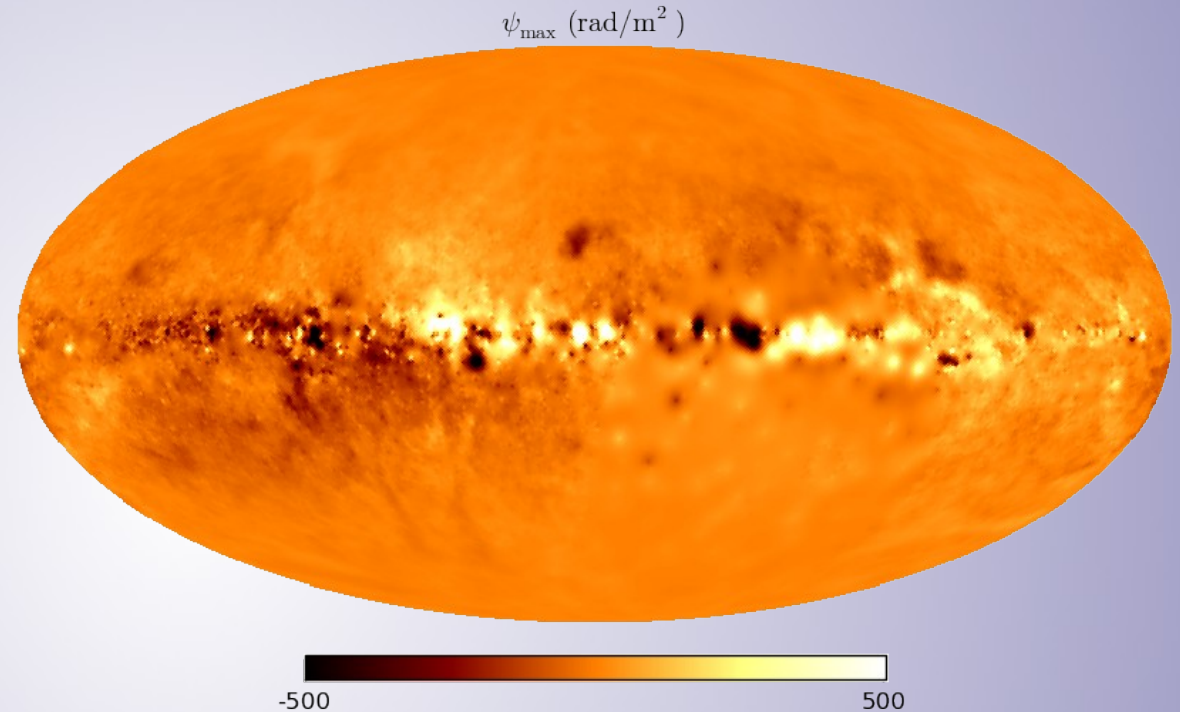
$$T_{\text{sync}}(\nu, \hat{\mathbf{n}}) = T_{408}(\hat{\mathbf{n}}) \left( \frac{\nu_H}{\nu} \right)^{\beta(\hat{\mathbf{n}})} + \Delta T_{\text{SCK}}(\nu, \hat{\mathbf{n}})$$

Alonso et al. 2013

# Intensity mapping simulations

Foregrounds: polarized synchrotron

- Very few observations of the polarized radio sky.
- Should improve with GMIMS, SKA
- Simplistic models (single Faraday screen)
- Simulations based on models of  $n_{CR}$ ,  $n_e$ ,  $B_{gal}$ . (Waelkens et al. 2009, HAMMURABI)



Oppermann et al. 2012

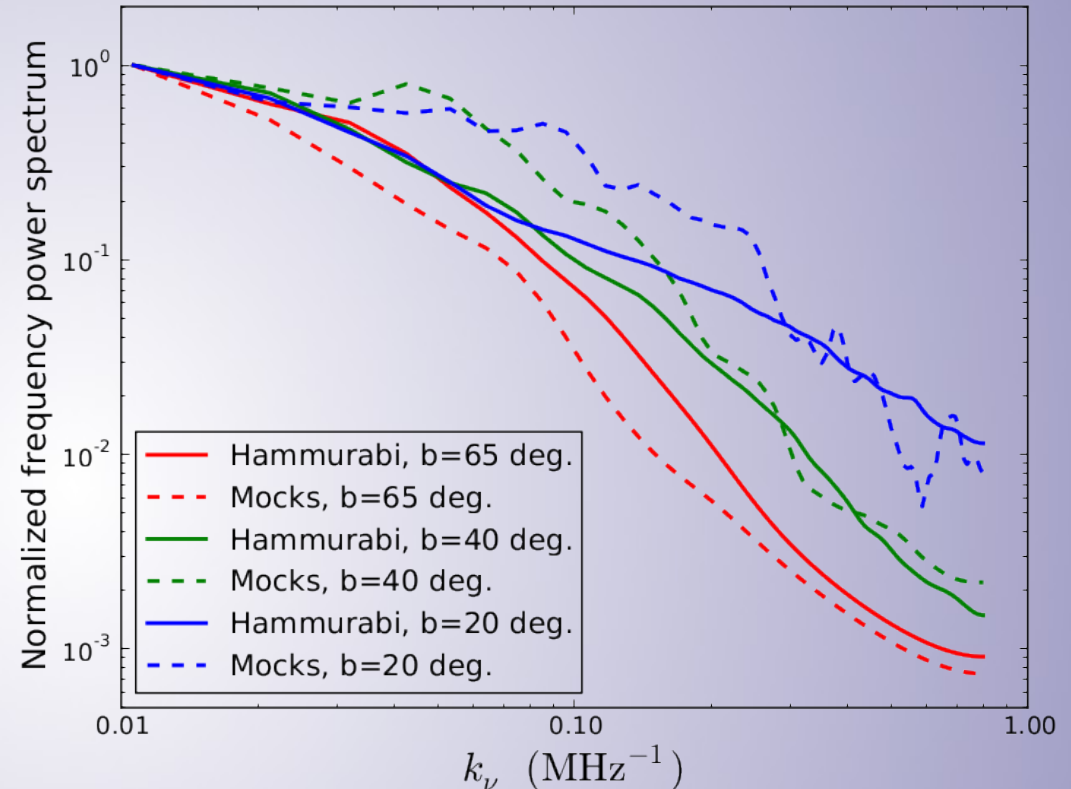
$$I_P(\nu, \hat{\mathbf{n}}) = \int d\psi k(\psi, \hat{\mathbf{n}}, \nu) e^{i\psi x_\nu}$$

Alonso et al. 2013

# Intensity mapping simulations

Foregrounds: polarized synchrotron

- Very few observations of the polarized radio sky.
- Should improve with GMIMS, SKA
- Simplistic models (single Faraday screen)
- Simulations based on models of  $n_{CR}$ ,  $n_e$ ,  $B_{gal}$ . (Waelkens et al. 2009, HAMMURABI)



$$I_P(\nu, \hat{\mathbf{n}}) = \int d\psi k(\psi, \hat{\mathbf{n}}, \nu) e^{i\psi x_\nu}$$

Alonso et al. 2013

# Blind foreground subtraction

