

# Observing the Epoch of Reionization with LOFAR

## Progress and challenges

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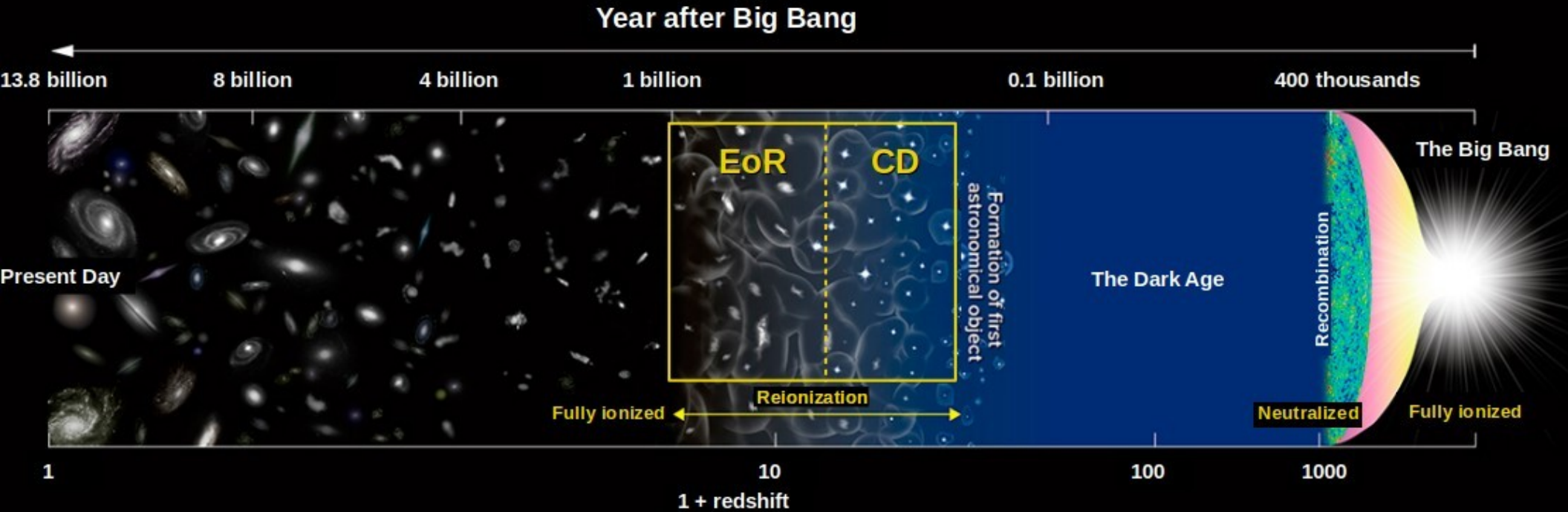
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**Sarod Yatawatta (ASTRON)**

**Saleem Zaroubi (K./Haifa)**

# Cosmic Dawn / Epoch of Reionization



Credit: NAOJ

## Epoch of Reionization

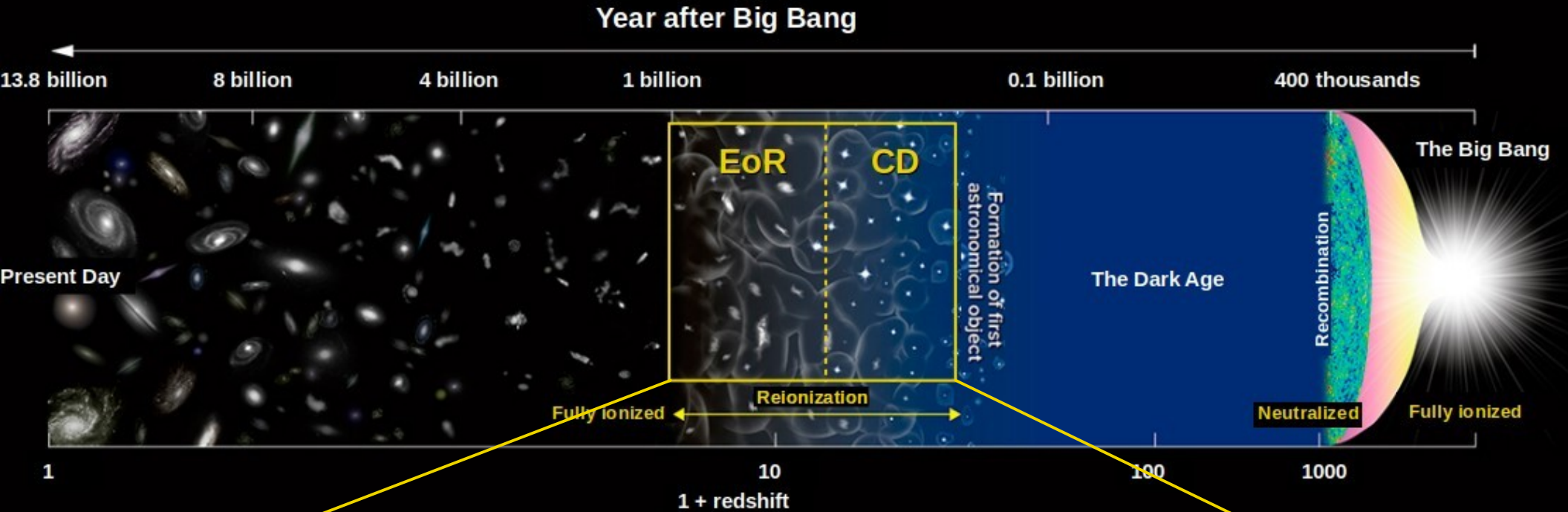
- Reionization by stars & mini-quasars
- IGM feedback (e.g. metals)
- PopIII - PopII transition
- Emergence of the visible universe

## Cosmic Dawn

- Appearance of first stars/Bhs (PopIII?)
- Ly- $\alpha$  radiation field
- Impact of Baryonic Bulk Flows
- First X-ray heating sources

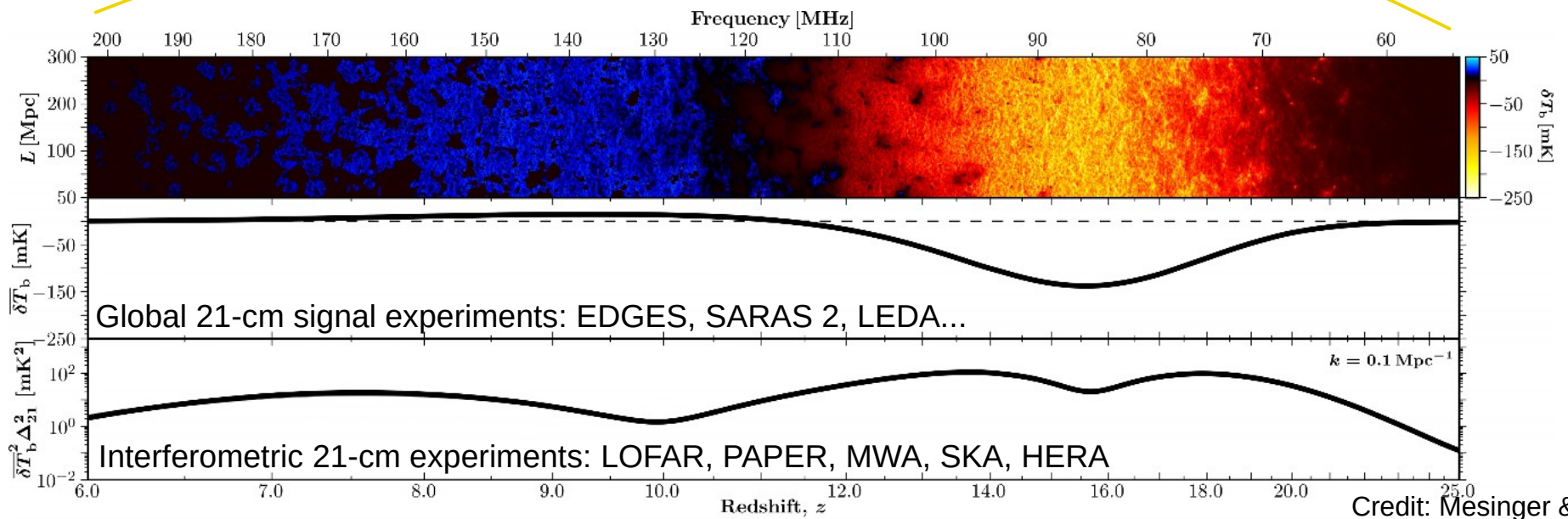
- When did the first galaxies/stars/black hole form?
- How did reionization proceed?
- How do galaxies form and evolve?

# Cosmic Dawn / Epoch of Reionization



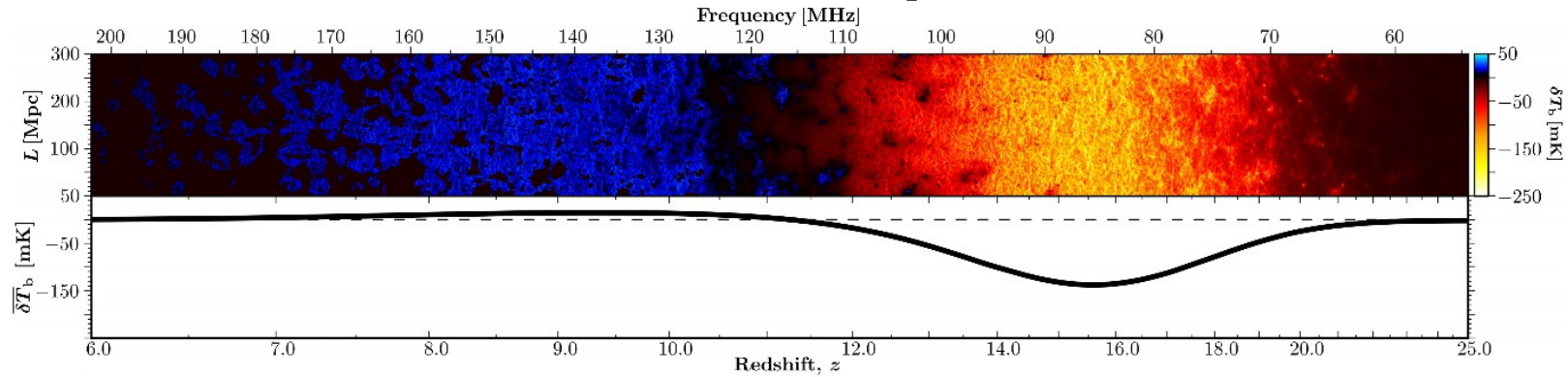
High-z HI 21-cm signal unique probe of the CD/EoR

Credit: NAOJ



Credit: Mesinger & Greig

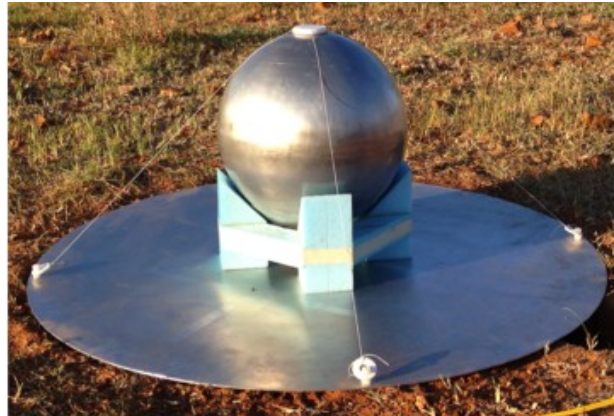
# The Global experiments



## PRISM

30-200 MHz  
Marion Island

Peterson, Sievers, Chiang ++



## SARAS

50-100, 100-200 MHz  
India (Himalayas)

Singh et al. 2017



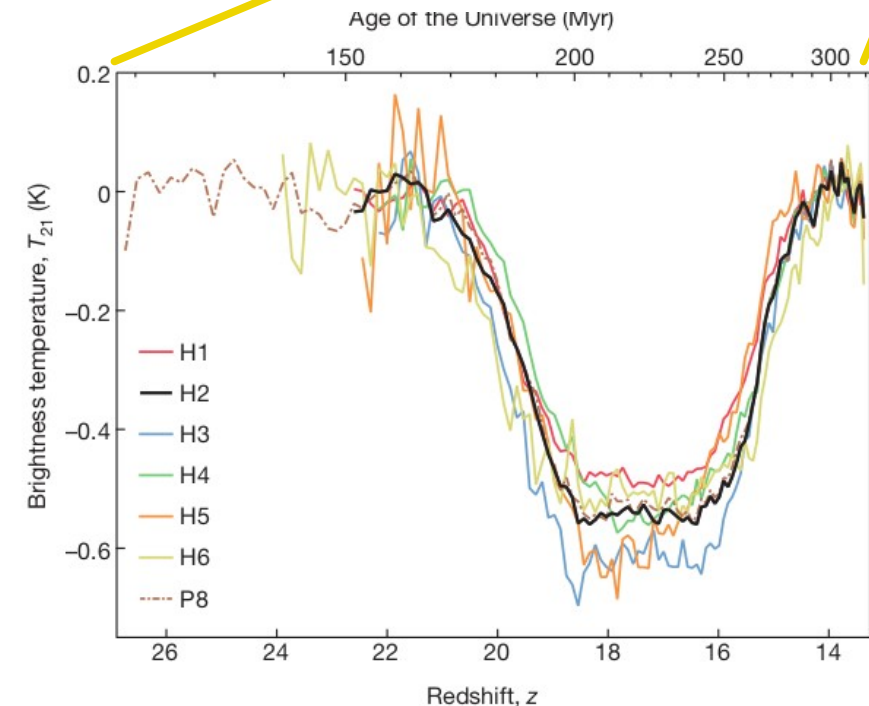
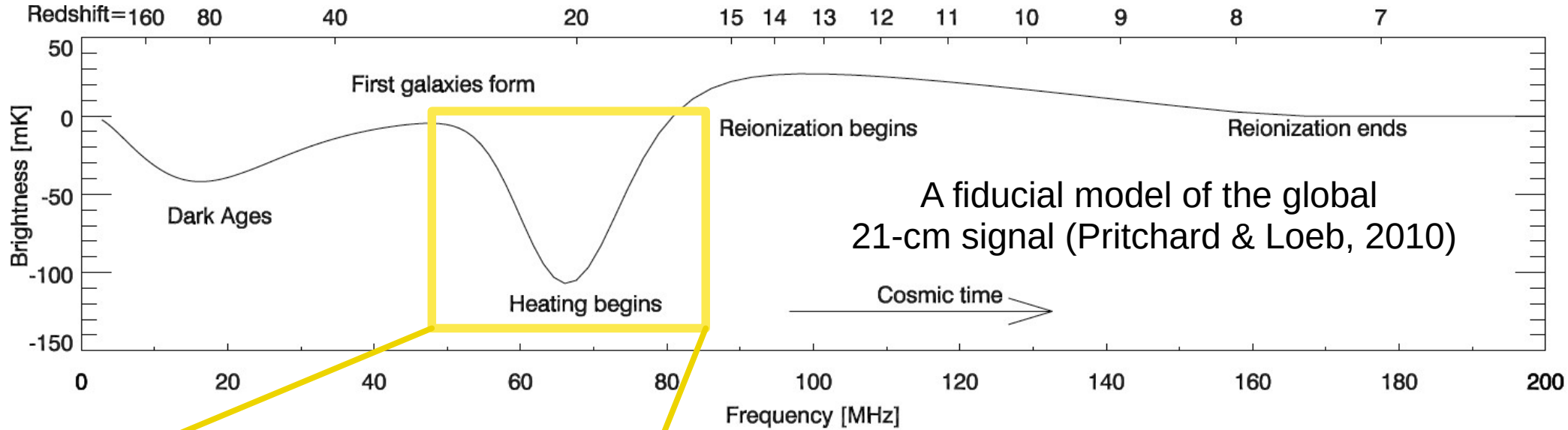
## EDGES

50-100, 100-200 MHz  
Western Australia

Rogers & Bowman 2008, 2012;  
Bowman et al 2018

+ Many more

# First Detection of the Cosmic Dawn (?)



Detection passed through numerous hardware and processing tests: **2 independent antennas, different hardware configurations, calibrations, fitting methods...**

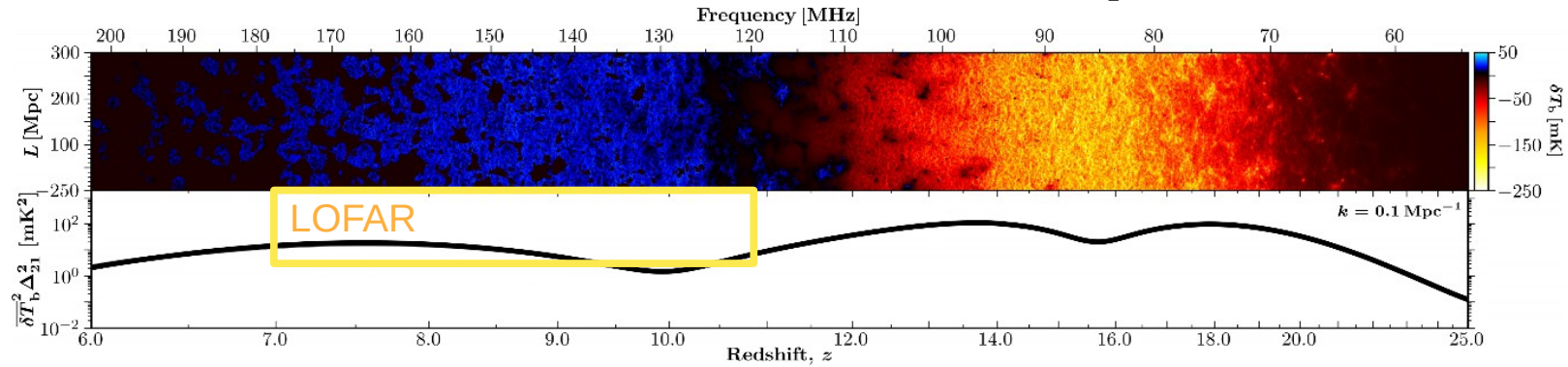
Profile is largely consistent with expectations, however **absorption about 2.5 x deeper than most extreme models!**

→ new science ? (e.g. Barkana, Nature, 2018)

**Need to be confirmed by other experiments !**

21-cm absorption profile observed by EDGES (Bowman et al., Nature, 2018)

# The Interferometric experiments



**GMRT**  
India

40 h @  $z \sim 8.5$   
Paciga et al. 2013



**PAPER**  
South Africa

1148 h @  $z=8.4$   
Ali et al. 2015  
**Retracted**



**MWA**  
Western Australia

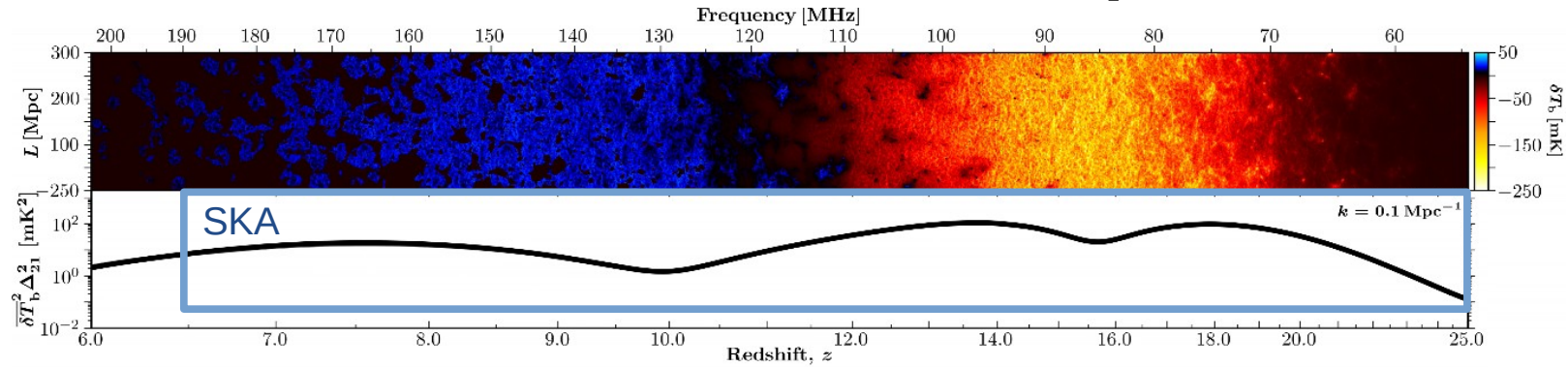
$z \sim 6 - 10$   
 $\sim 32$  h published  
Beardsley et al. 2016  
MWA phase 2



**LOFAR**  
The Netherlands

$z \sim 7 - 11$   
+ 2000 h observed  
13h published  
Patil et al. 2017  
140h in prep.

# The Interferometric experiments



## Second generation experiments in near and far future



### HERA

South Africa

$z \sim 6 - 25$

240 dishes of 14 m (by  $\sim 2020$ )

In (partial) commissioning



### SKA

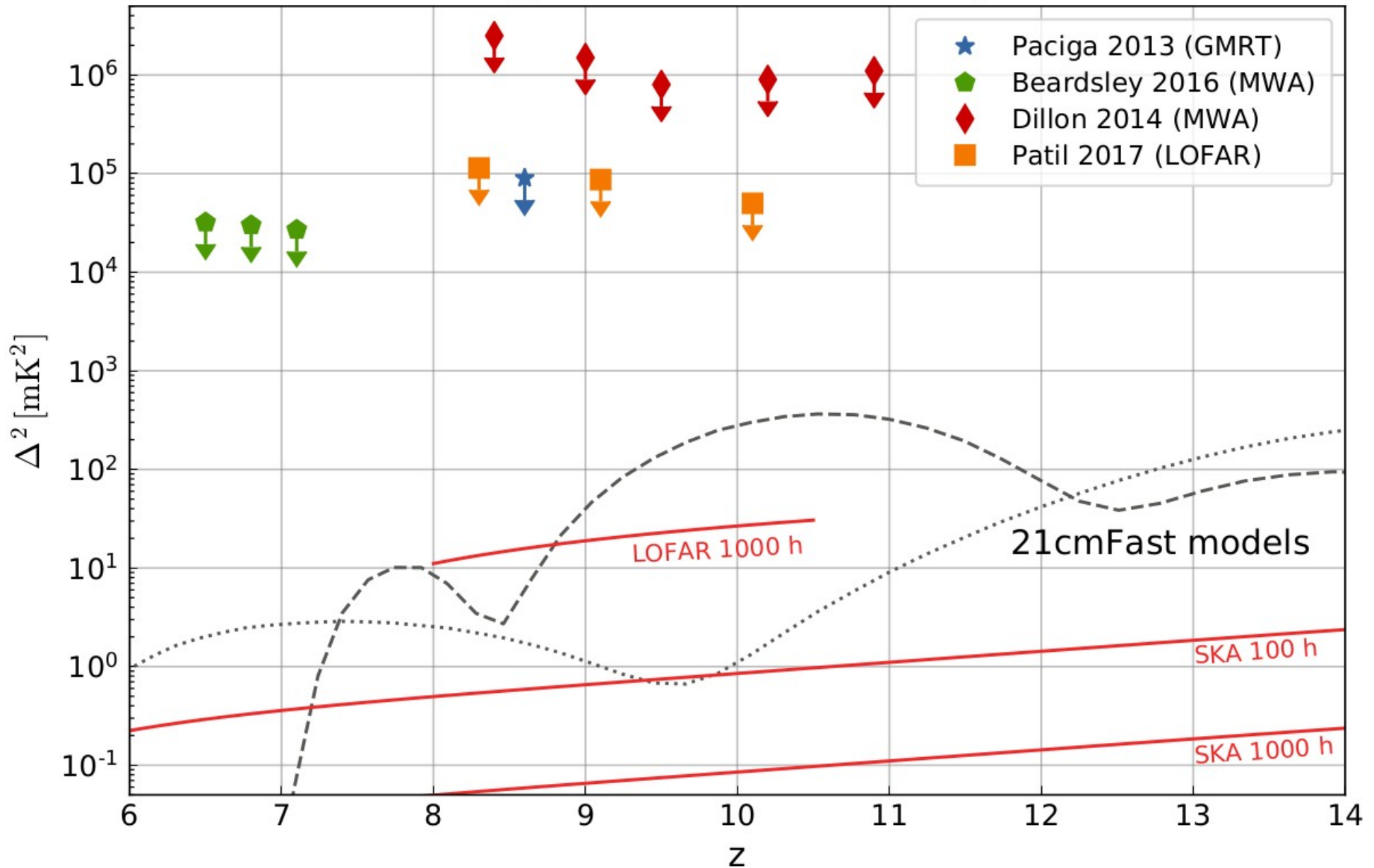
Western Australia

Low band ( $z \sim 6 - 25$ )

Construction 2020-2025

# Where do we stand ?

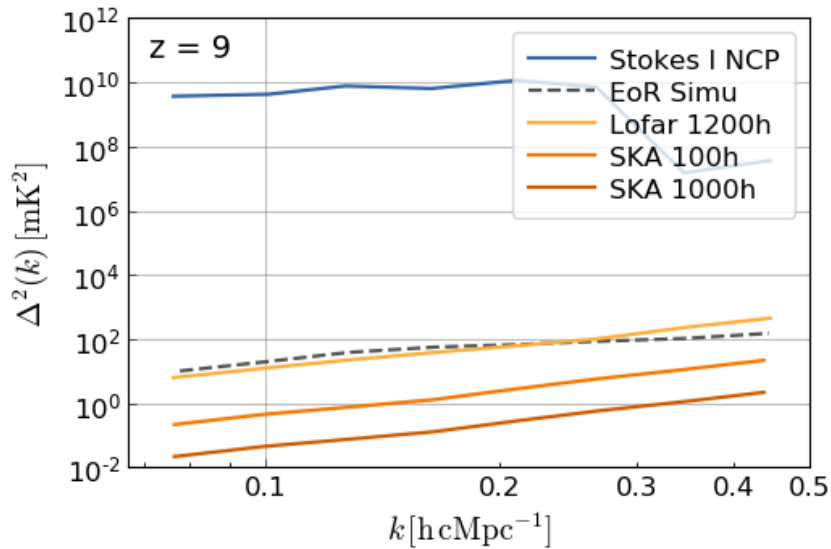
$2\sigma$  upper limits at  $k = 0.1 \text{ hMpc}^{-1}$



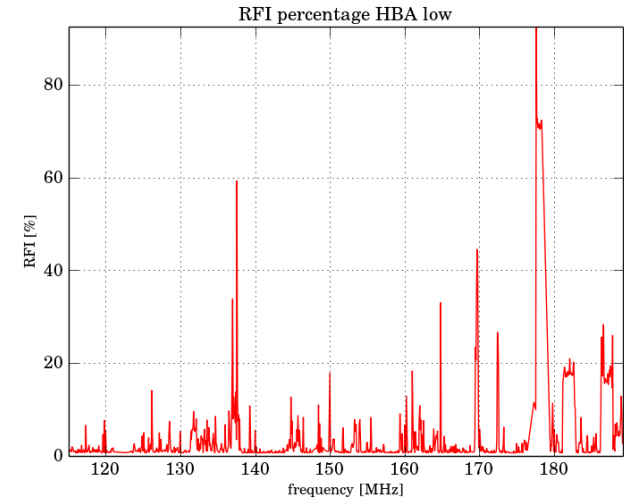


# Why is it so challenging ?

## Foregrounds

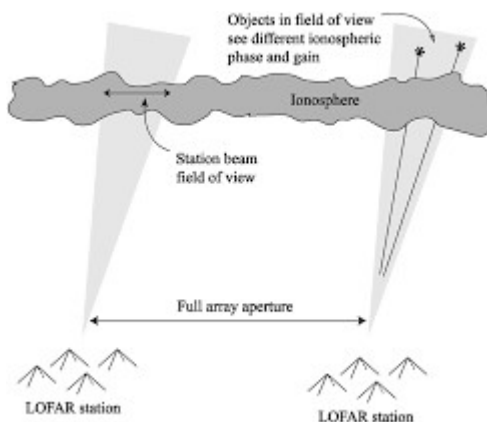


## Radio Frequency Interference (RFI)



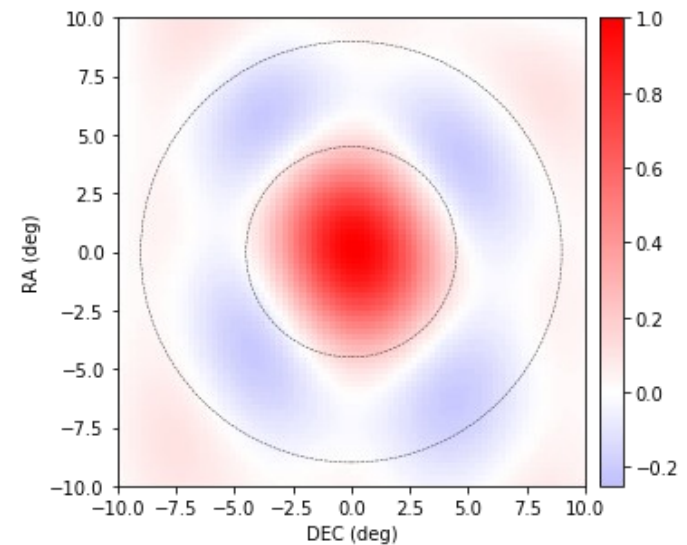
Credit: A. Offringa

## Ionosphere



Credit: S. Van der Tol

## Primary beam



# The challenge of the foregrounds

## 21-cm signal:

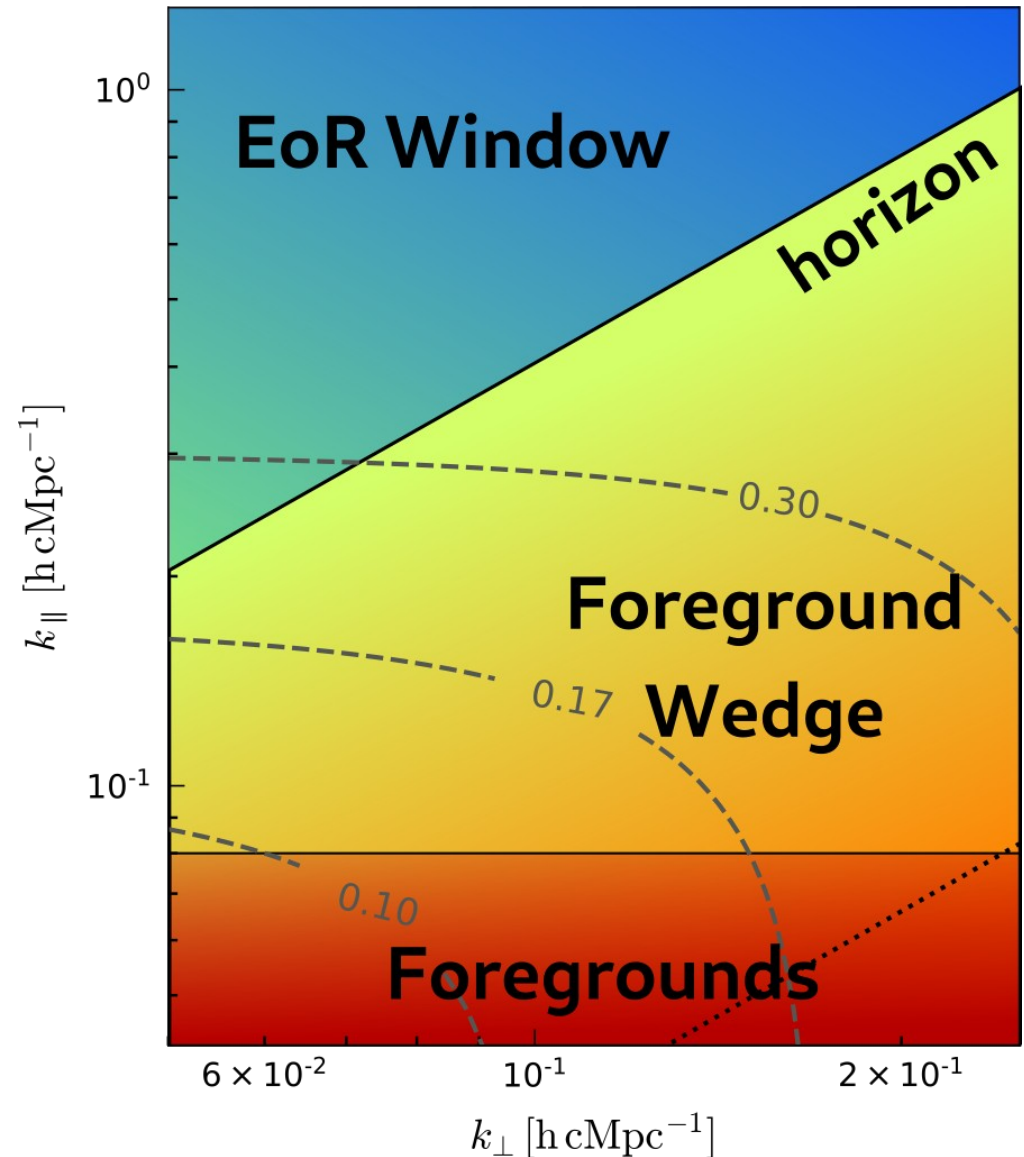
- Uncorrelated  $\sim$  MHz
- Isotropic

## Foreground emission:

- Mainly synchrotron and free-free emission
- Smooth in frequency

## Foreground Wedge:

- Chromatic instrument (beam/uv-coverage)
- Ionosphere
- Calibration error
- Polarization leakage



Spatial vs line-of-sight power-spectra

# Removing the foregrounds

## Step 1:

### Point-sources subtraction

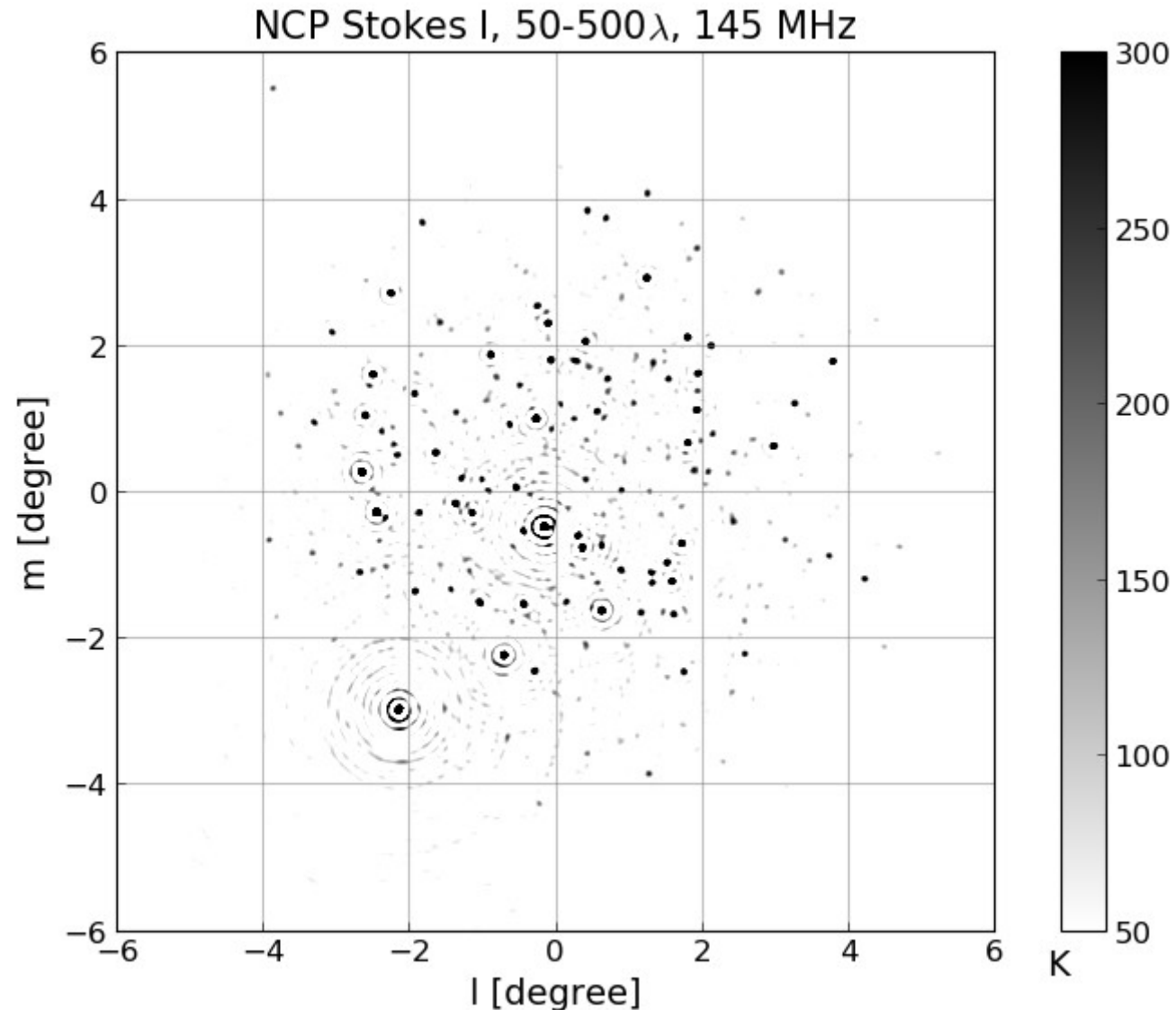
- Need accurate sky-model
- Solve for instruments gains in direction of sources

Direction Dependent (DD) calibration using Sagecal-CO (Yattawatta et al. 2013, 1015, ...)

## Step 2:

### Residual spectrally-smooth foregrounds subtraction

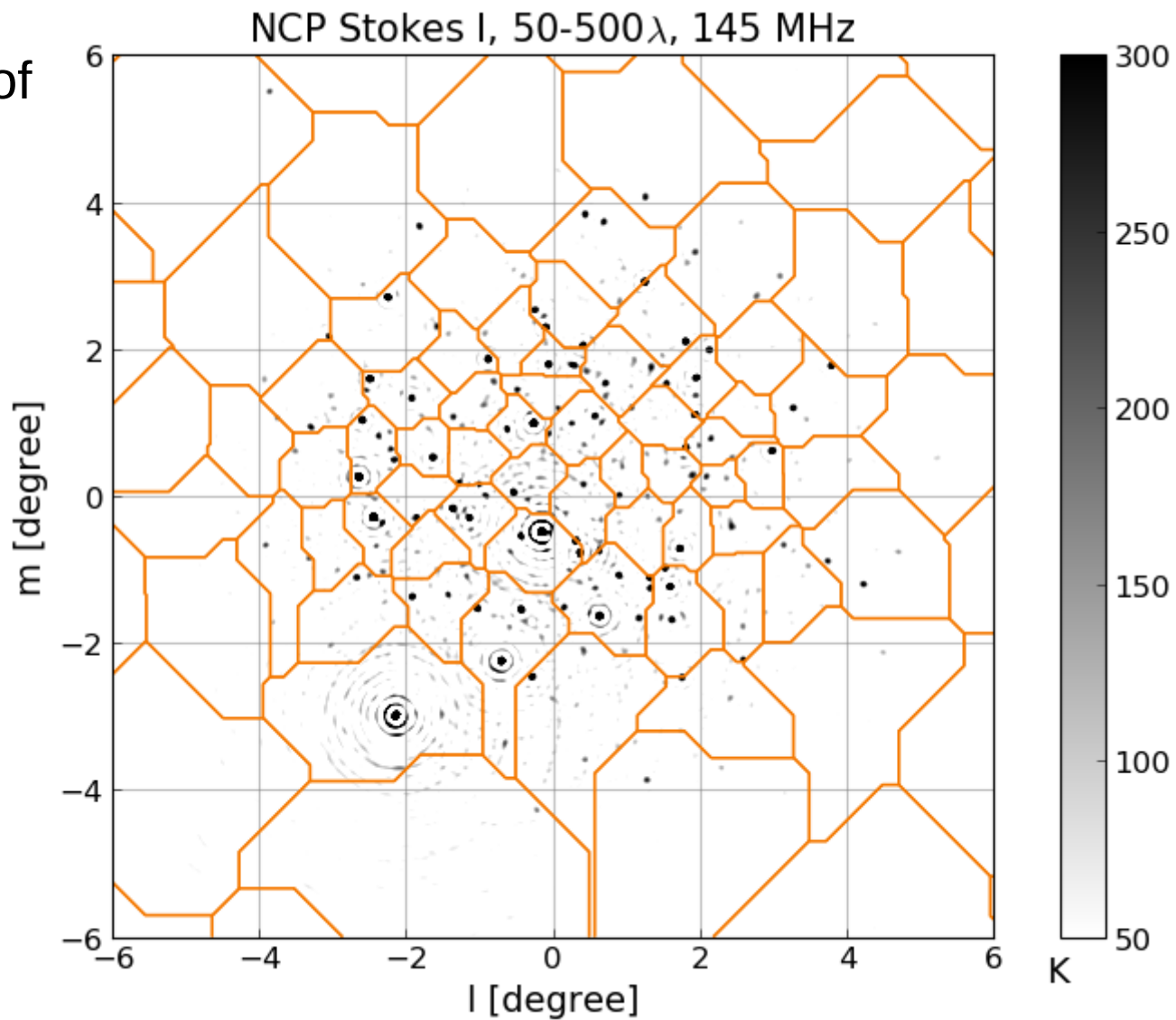
Using e.g. Gaussian Process Regression (GPR) (Mertens et al. 2018)



# Direction Dependent calibration

Need to reduce the number of degree of freedom:

→ Clustering (NCP ~ 120 clusters)



(Yatawatta et al. 2013, 2015)

# Direction Dependent calibration

Need to reduce the number of degree of freedom:

- Clustering (NCP ~ 120 clusters)
- Force spectrally-smooth instrumental response

Sagecal-CO: distributed calibration, solve augmented Lagrangian:

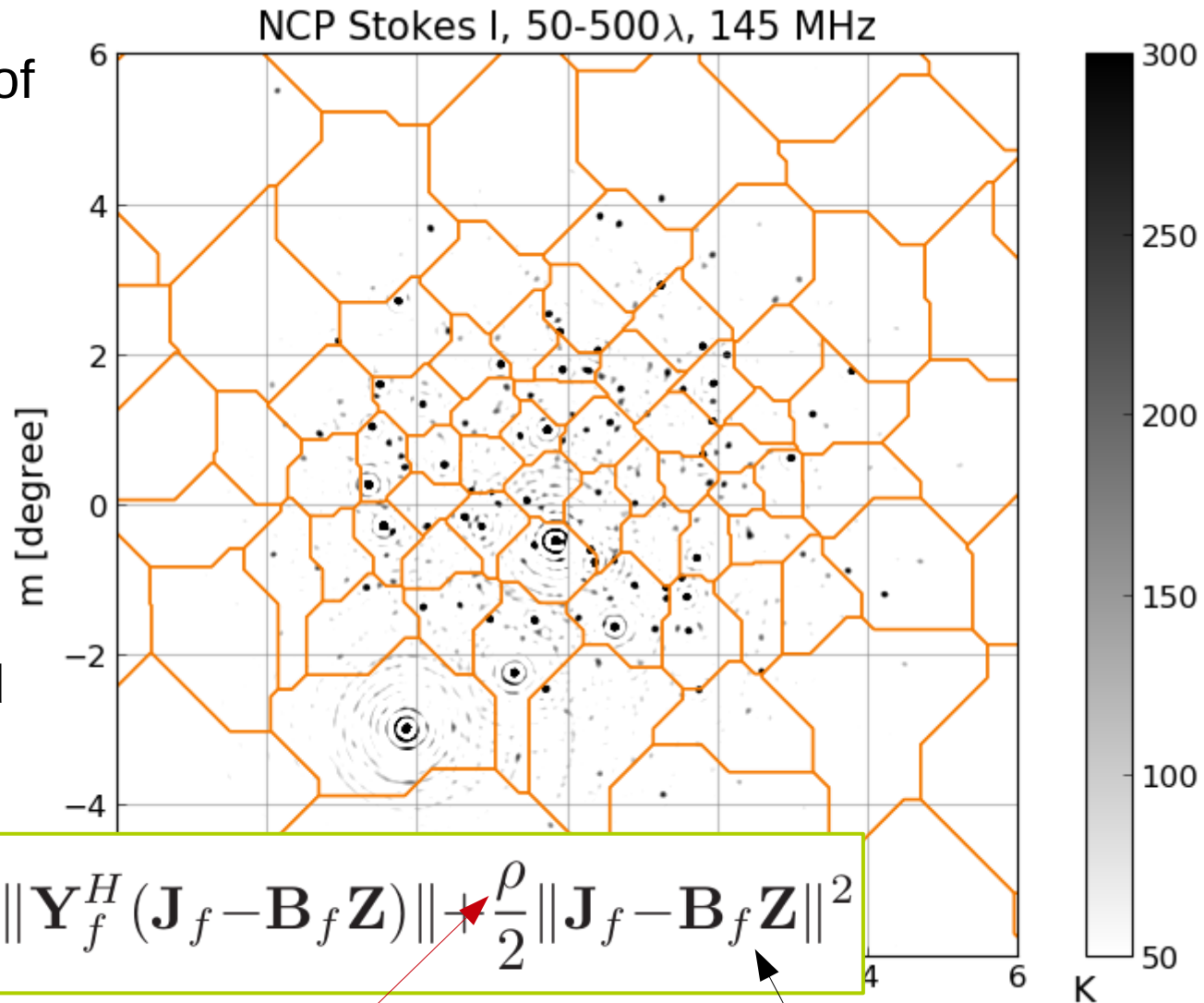
$$L_f(\mathbf{J}_f, \mathbf{Z}, \mathbf{Y}_f) = g_f(\mathbf{J}_f) + \|\mathbf{Y}_f^H (\mathbf{J}_f - \mathbf{B}_f \mathbf{Z})\| + \frac{\rho}{2} \|\mathbf{J}_f - \mathbf{B}_f \mathbf{Z}\|^2$$

Gains

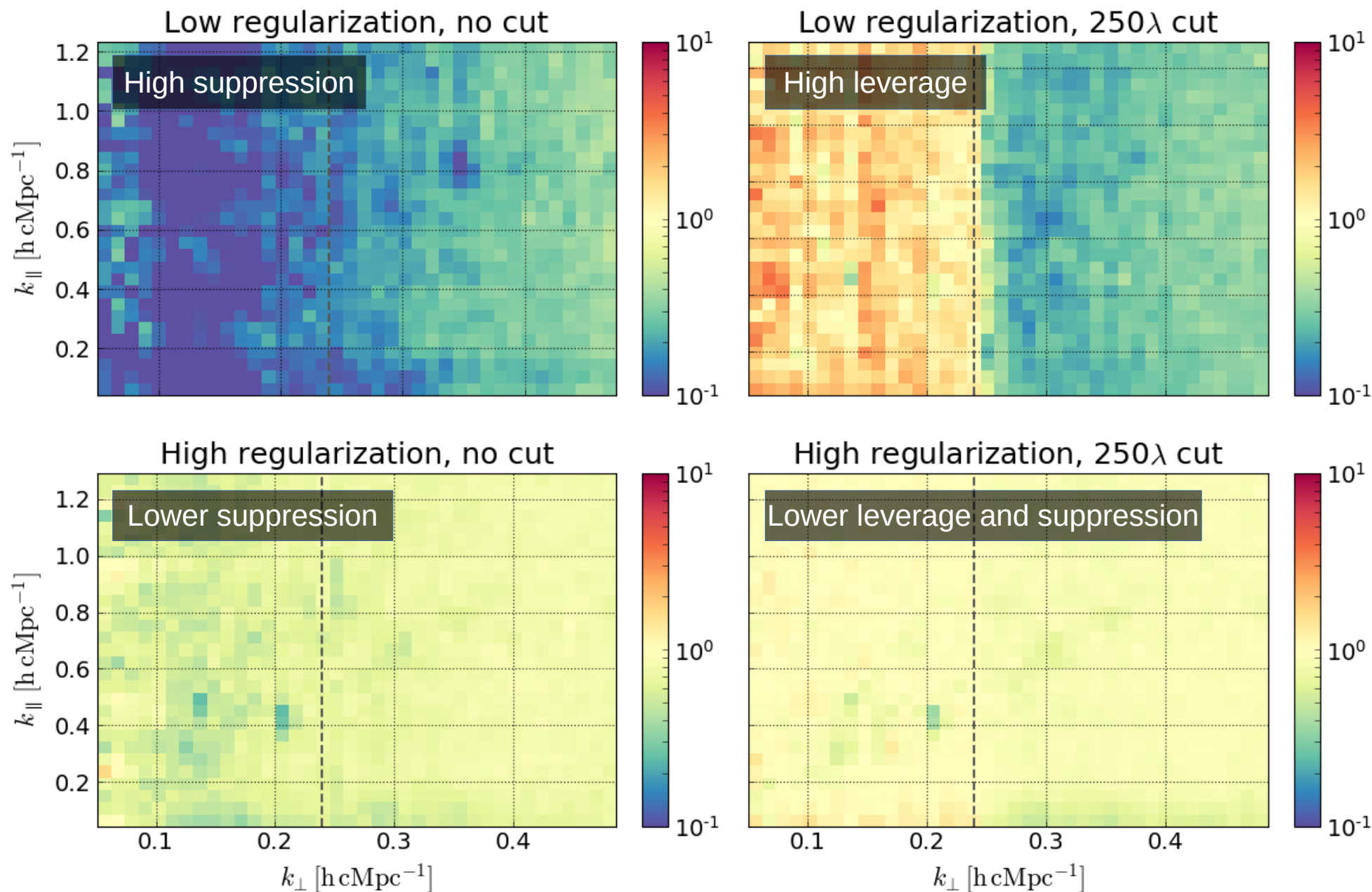
Original cost function

Regularization parameter

Spectrally-smooth constraint



# DD calibration: effect of enforcing smoothness



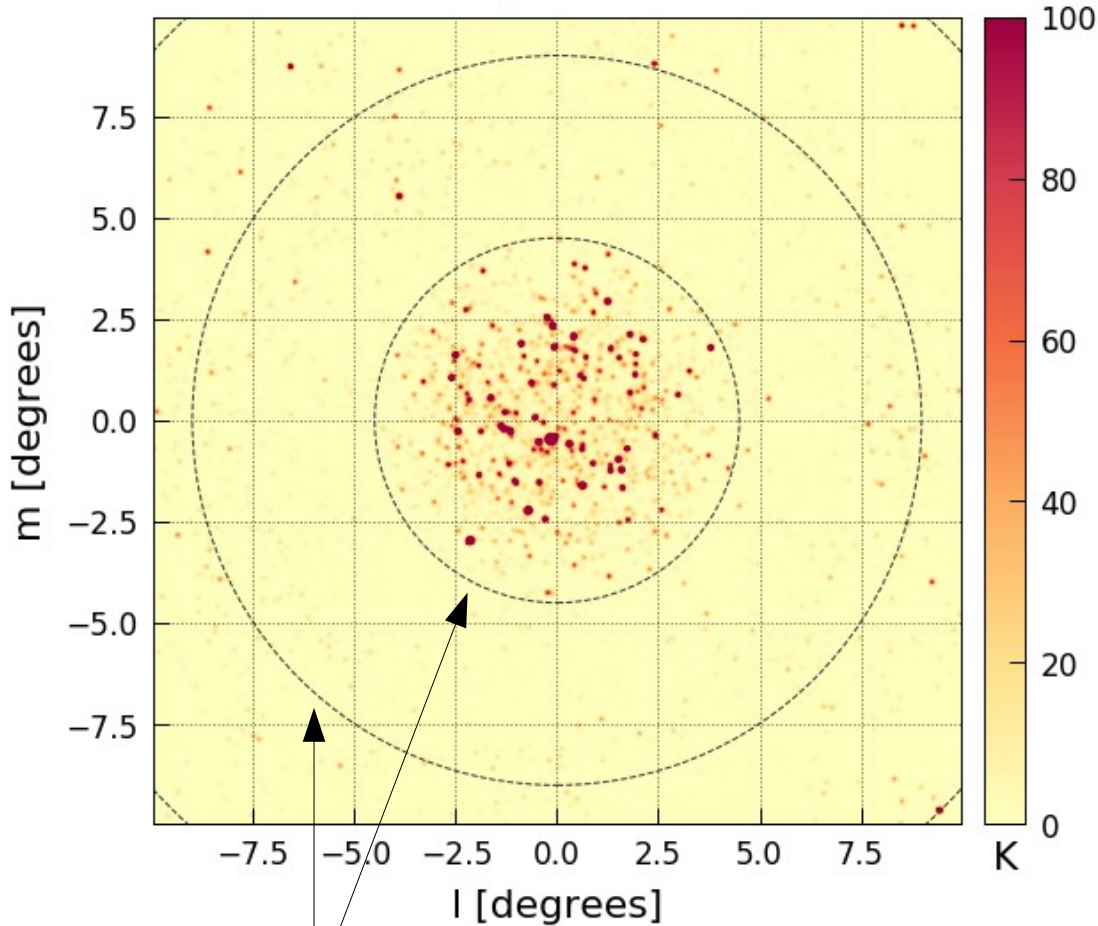
Ratio of Stokes V before/after DD show the effect of enforcing frequency-smoothness

(Mevius, Mertens, et al in prep.)  
See also Sardarabadi et al. 2018 (and poster!)

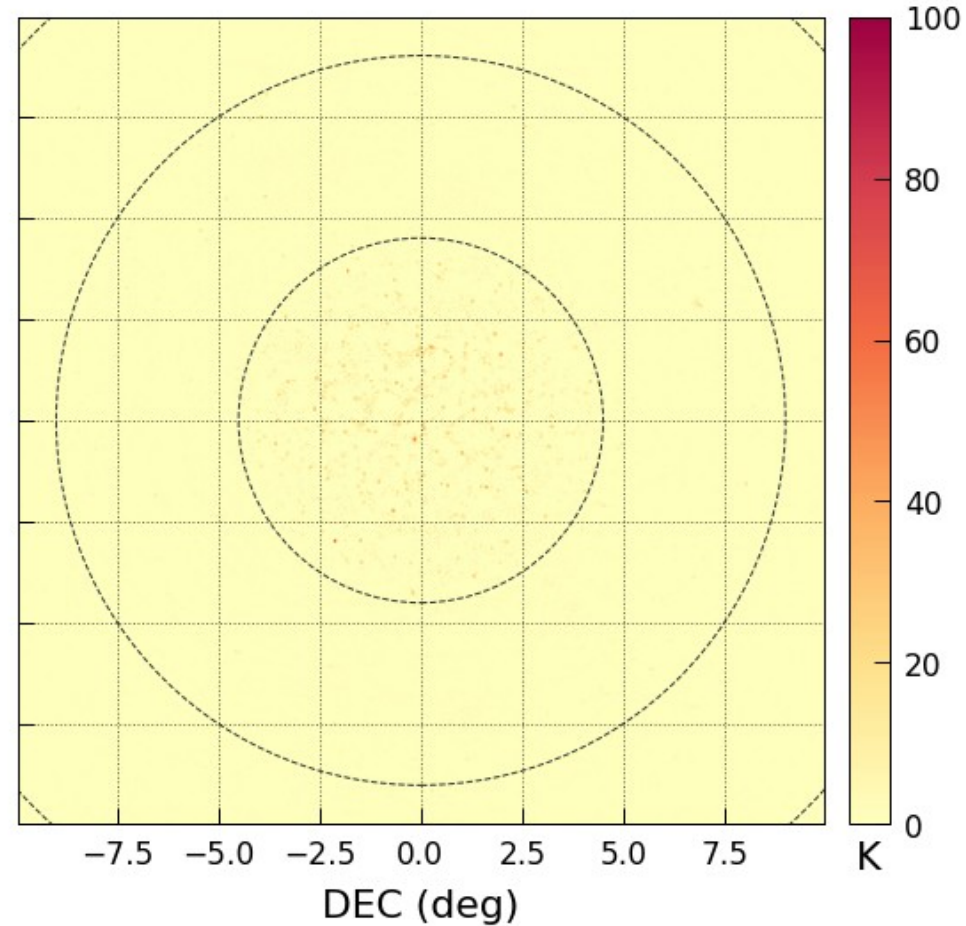
# DD calibration results

NCP field, 140 hours, 134-146 MHz,  $z \sim 9.1$

Sky model



Stokes I after DD, 50-500  $\lambda$

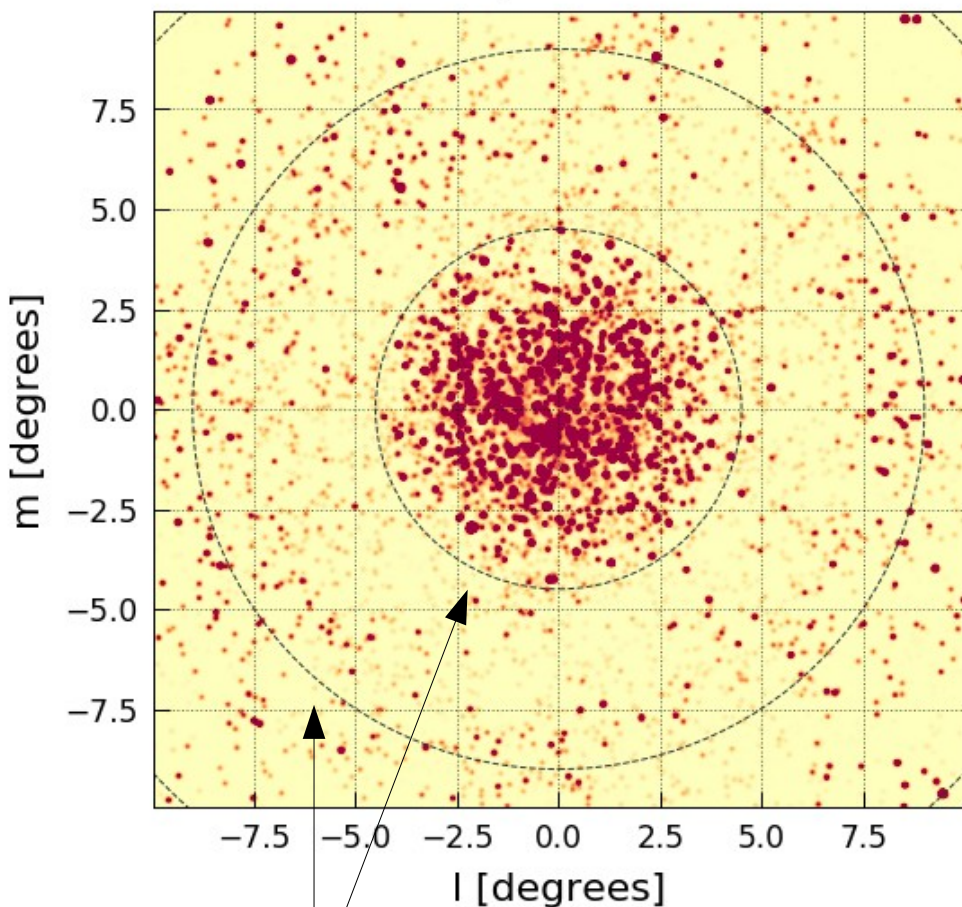


First and second null  
of the Primary Beam

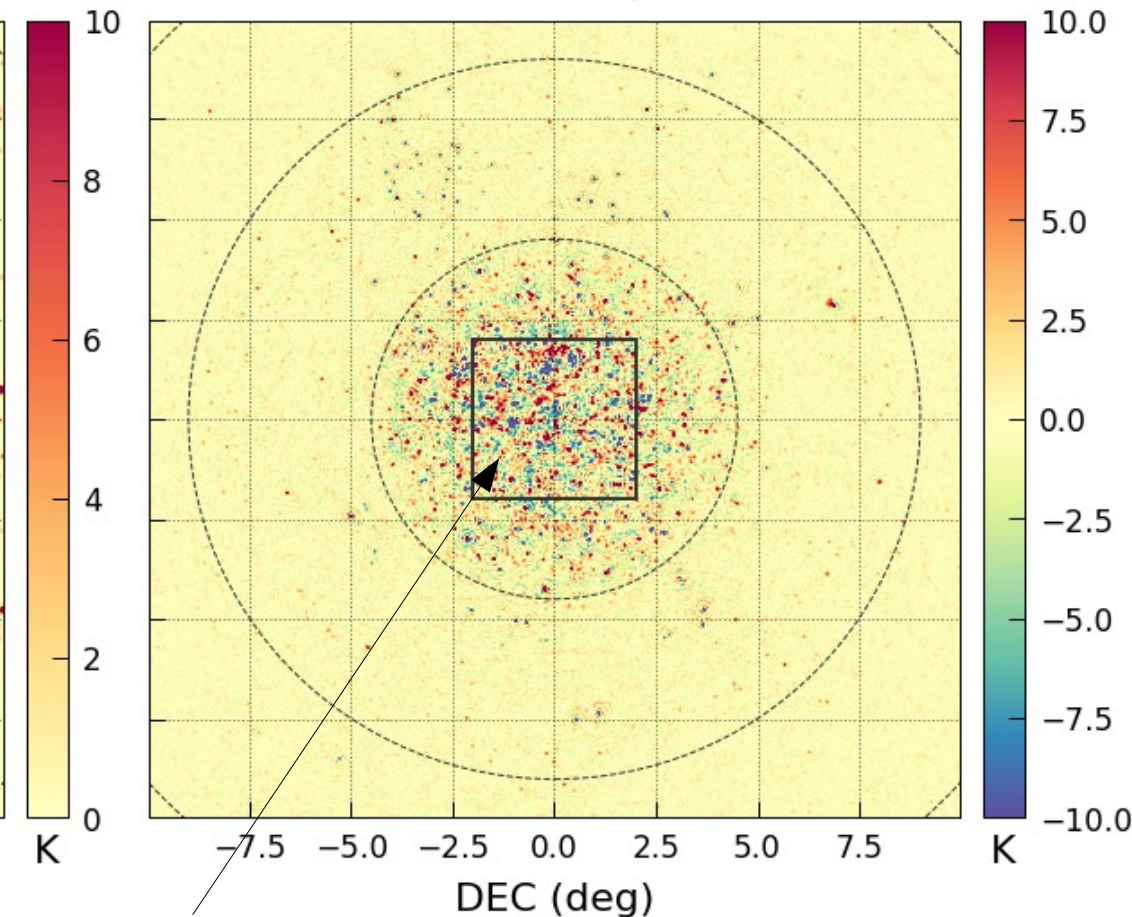
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First and second null  
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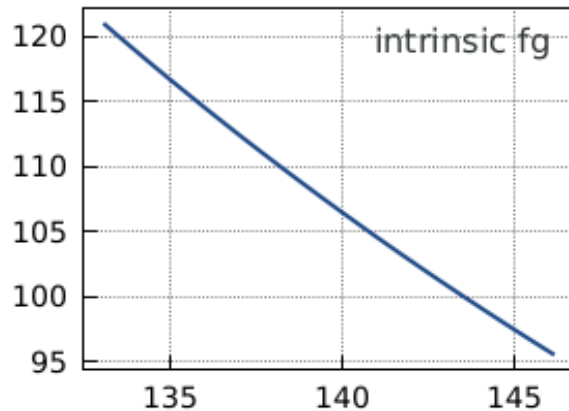
Inner 4x4 where we  
look for the signal

Next step: Remove confusion-limited foregrounds

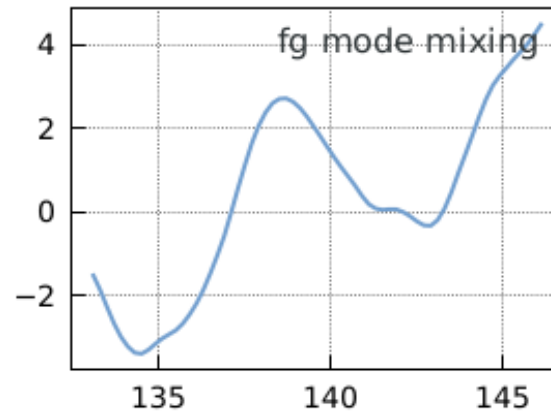


# GPR modeling for 21-cm experiments

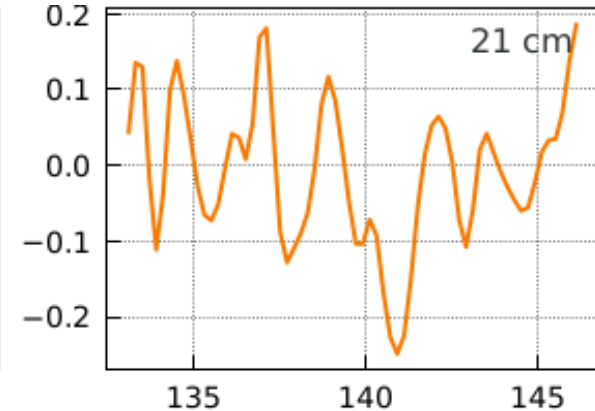
Residual data can be decomposed in three main components:



**Residual astrophysical sources:**  
Smooth in frequency



**Mode mixing:**  
Less frequency smooth



**21-cm signal:**  
Uncorrelated ~ MHz

GPR: uses Gaussian Process (GP) as prior information  $\mathbf{f} \sim \mathcal{N}(0, K)$

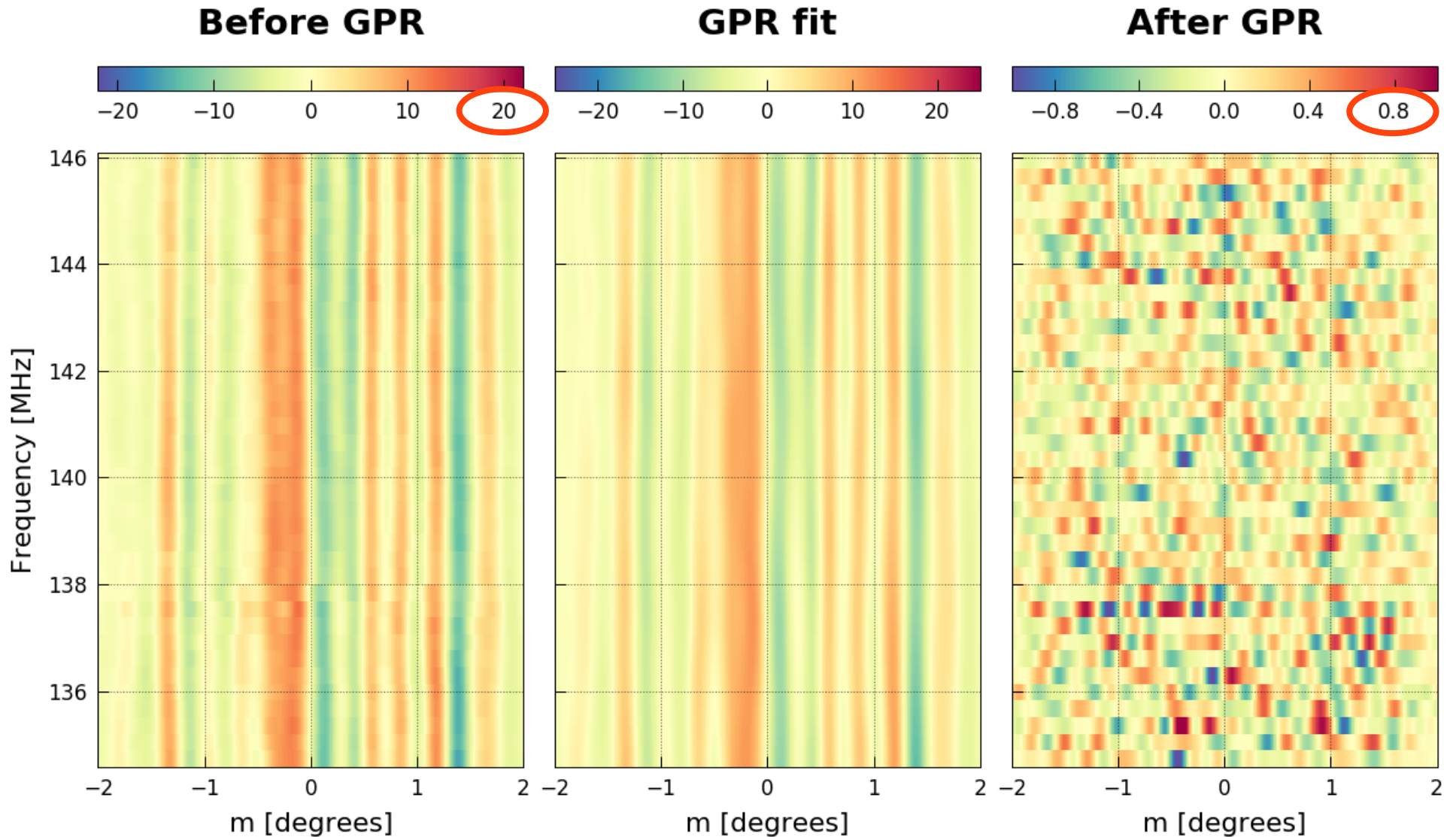
$$E(\mathbf{f}_{\text{fg}}) = K_{\text{fg}} [K_{\text{fg}} + K_{21} + \sigma_n^2 I]^{-1} \mathbf{d}$$

$$\text{cov}(\mathbf{f}_{\text{fg}}) = K_{\text{fg}} - K_{\text{fg}} [K_{\text{fg}} + K_{21} + \sigma_n^2 I]^{-1} K_{\text{fg}}$$

- ➔ Parametric Covariance optimized by maximizing the marginal likelihood (i.e. Bayesian evidence).
- ➔ Including prior information on the covariance contribution of the signal is key to avoid signal suppression!

# GPR on LOFAR data

NCP field, 140 hours, 134-146 MHz,  $z \sim 9.1$

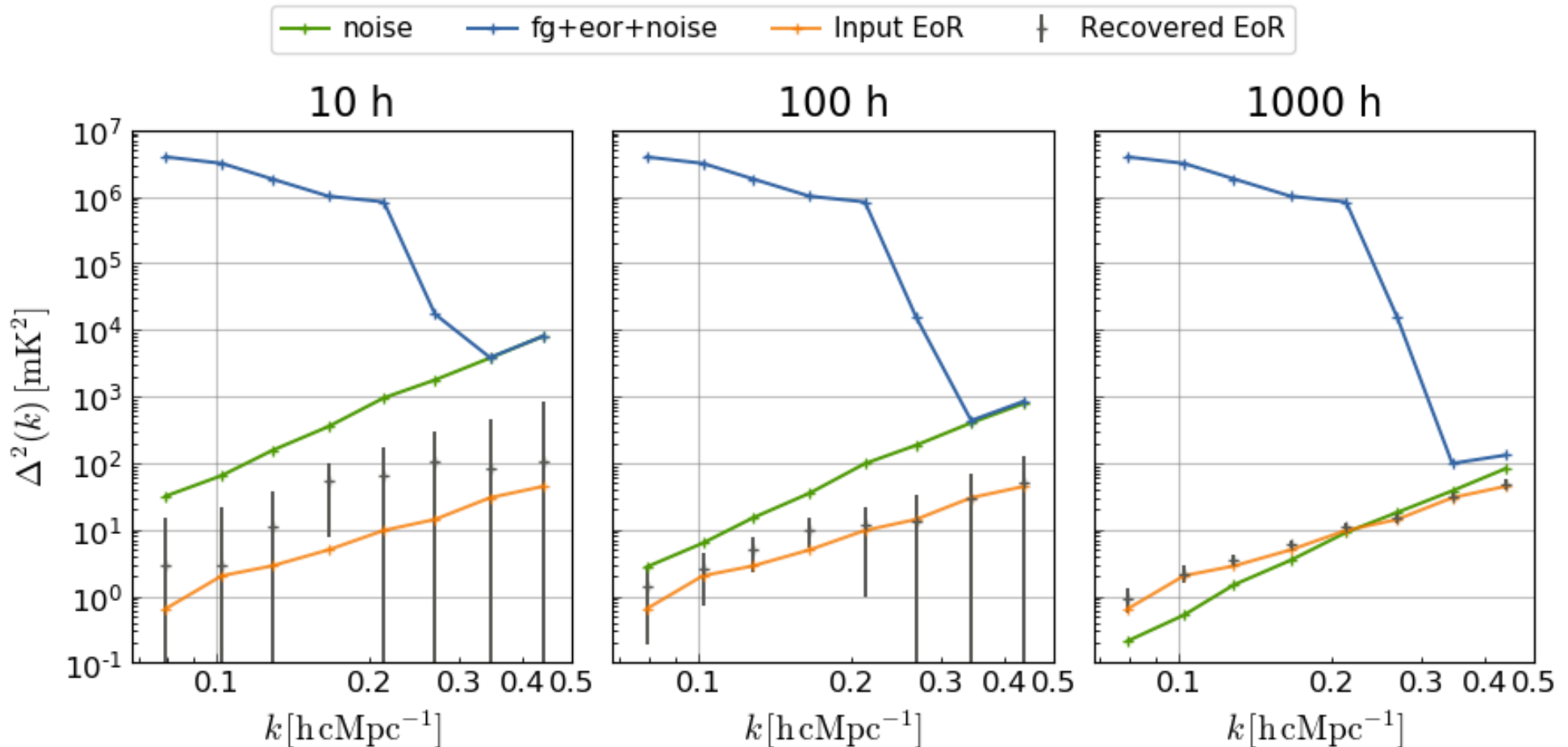


GPR remove frequency-coherent structure  
Residual power level close to thermal noise

# GPR on SKA simulation

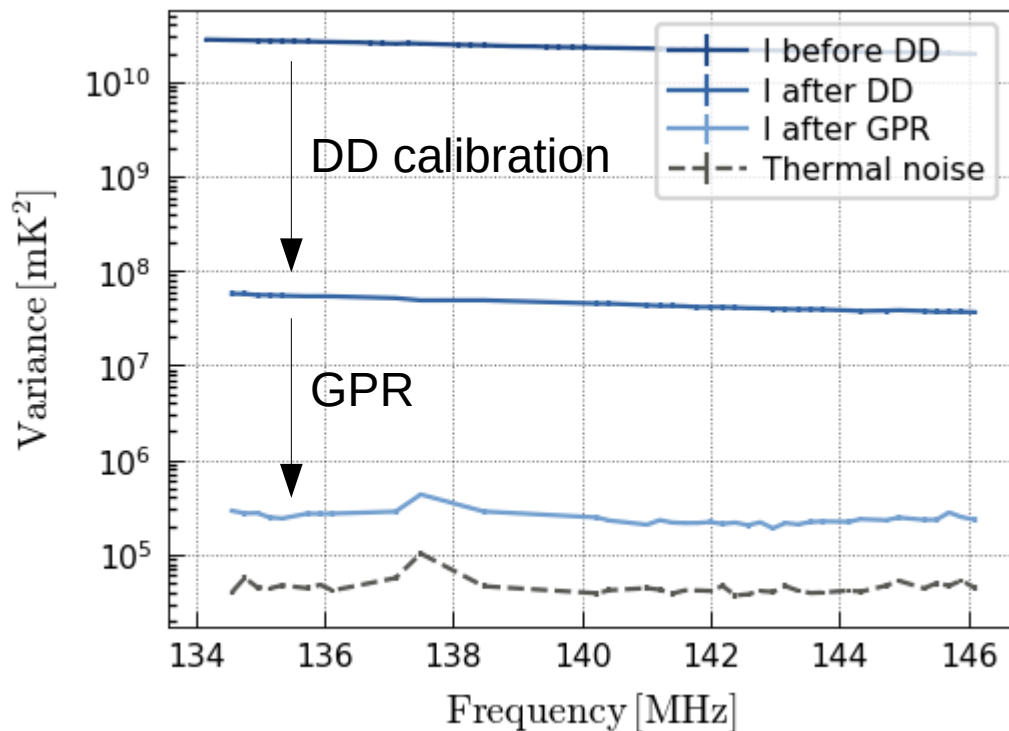
## Simulation (from Modhurita Mitra for the SKA CD/EoR blind challenge):

- **Intrinsic foregrounds**: galactic diffuse emission, 10 degree FoV
- **21-cm input signal**: simulated from 21cmFast
- **noise**: equivalent to 10-100-1000 hours of SKA observation
- Visibility simulated using OSKAR



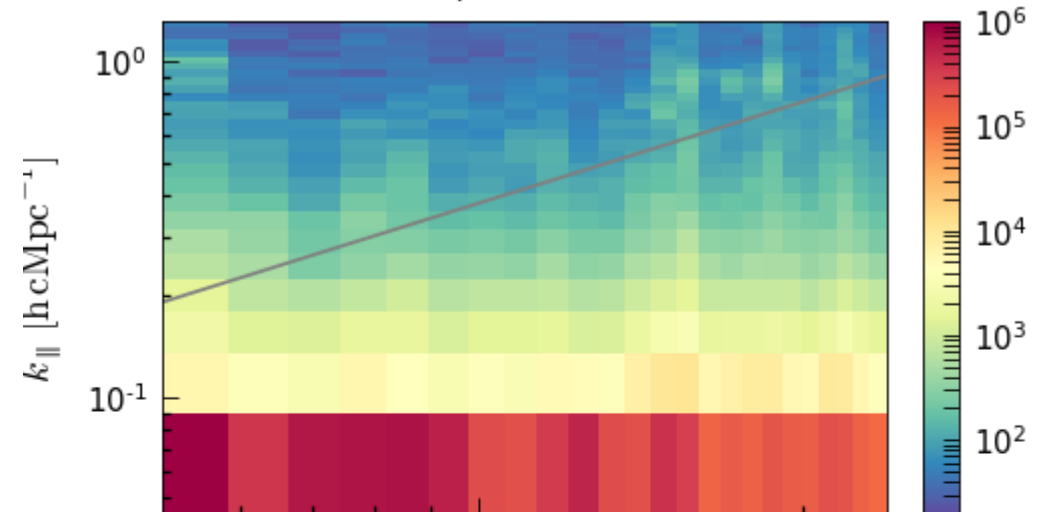
# GPR on LOFAR data

NCP field, 140 hours, 134-146 MHz,  $z \sim 9.1$

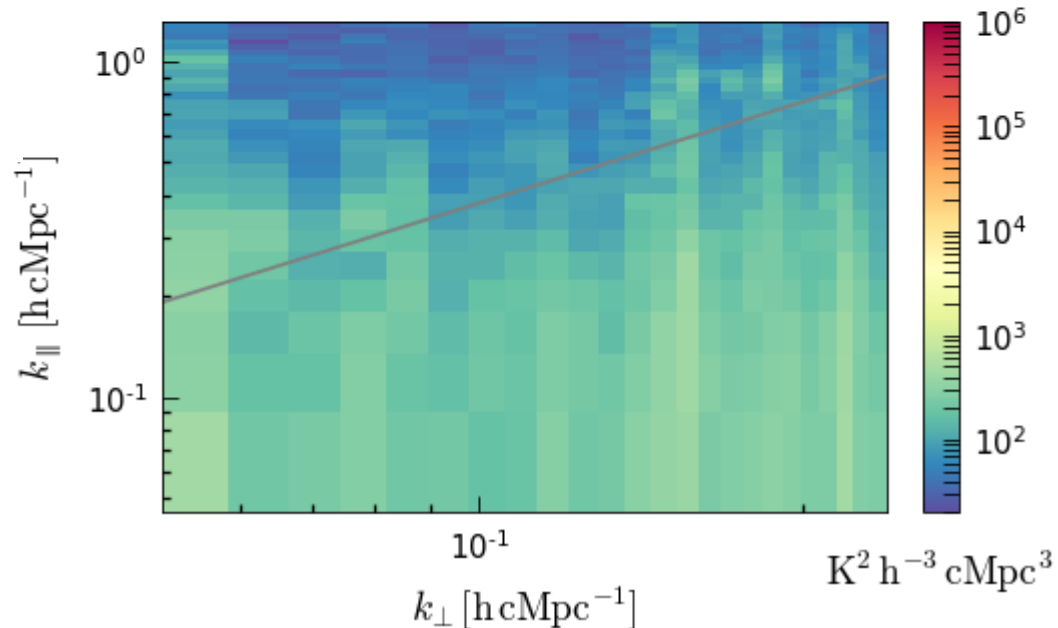


- ➔ DD calibration reduce foregrounds power by an order of magnitude down to confusion limit
- ➔ GPR remove residual foregrounds down to (very close to) noise level
- ➔ Residual power mostly incoherent between nights

2D PS, before GPR

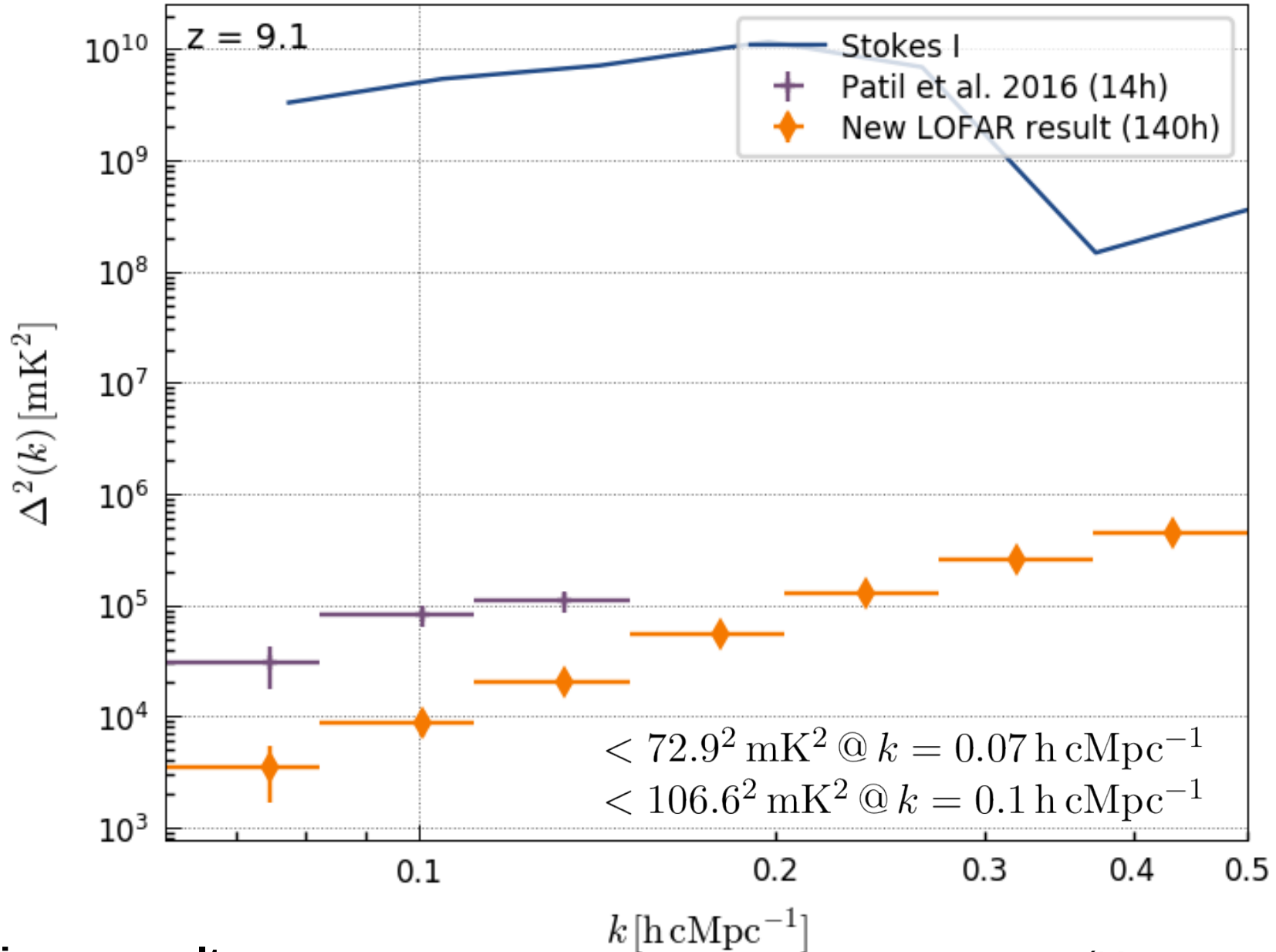


2D PS, after GPR



# New upper limit !

NCP field, 140 hours, 134-146 MHz,  $z \sim 9.1$

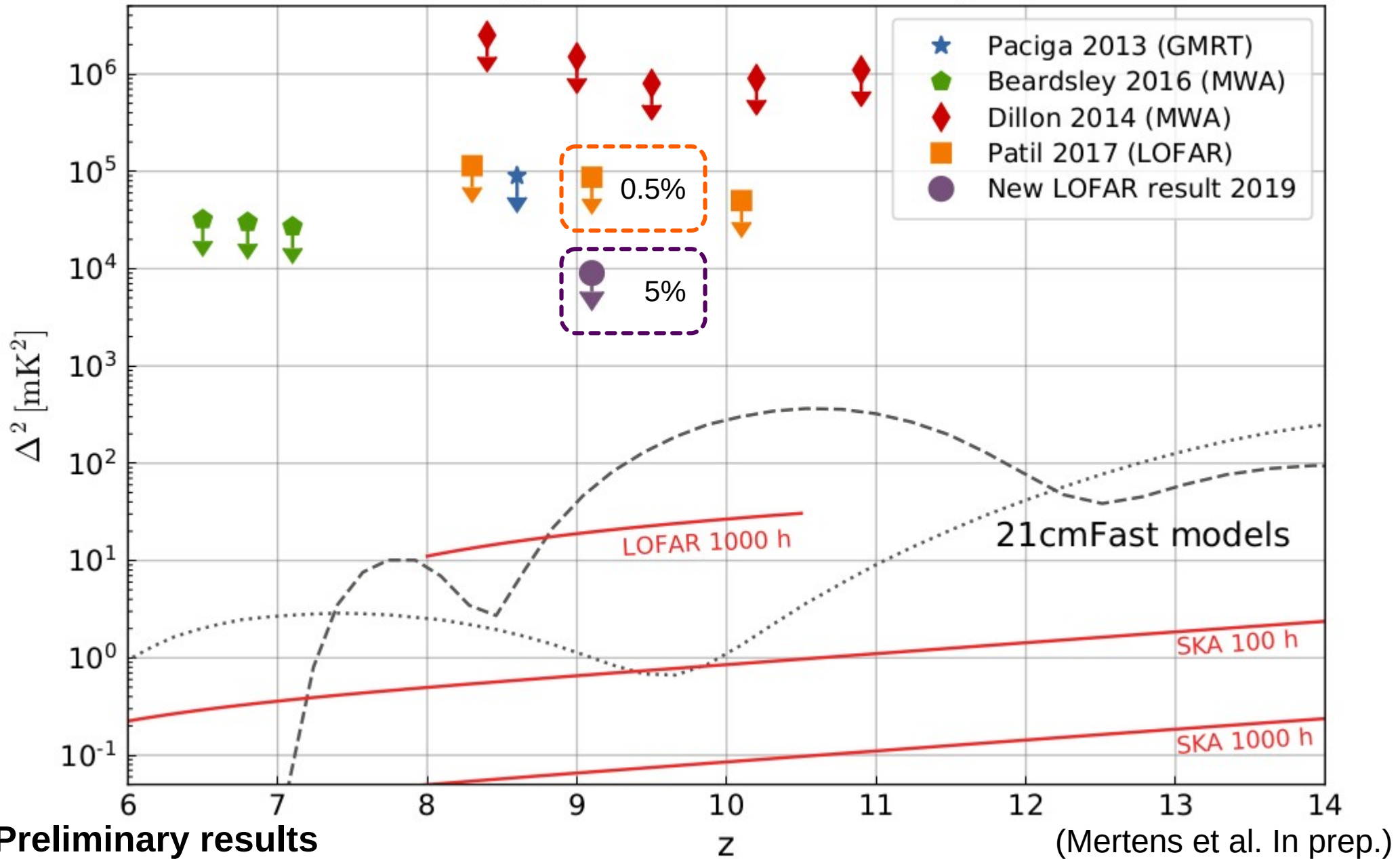


Preliminary results

(Mertens et al. In prep.)

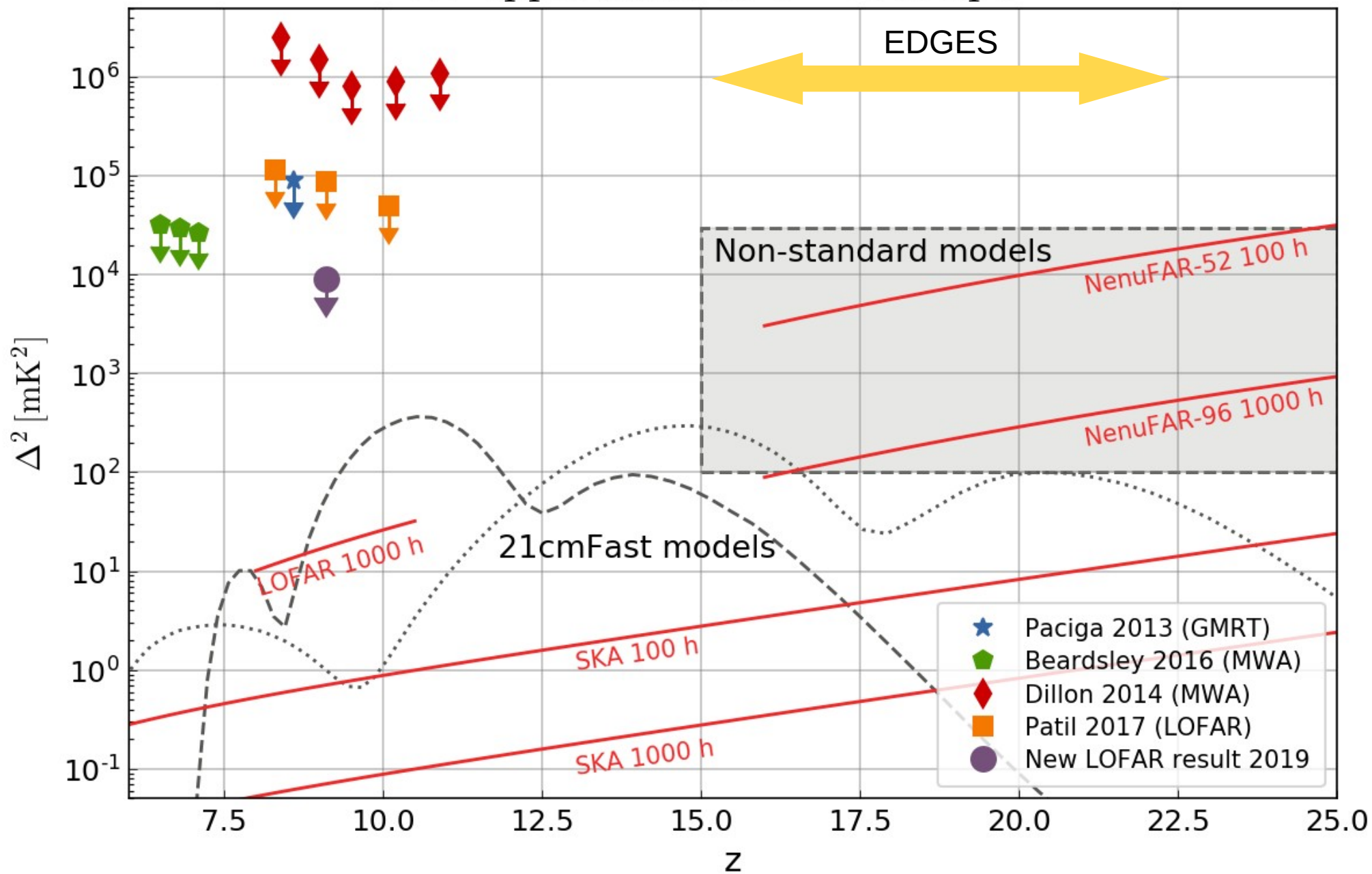
# Where do we stand ? (updated)

$2\sigma$  upper limits at  $k = 0.1 \text{ hMpc}^{-1}$



# Perspective: ACE, NenuFAR, SKA

$2\sigma$  upper limits at  $k = 0.1 \text{ hMpc}^{-1}$



# Summary

- The 21-cm signal from the Dark Ages, Cosmic Dawn and Reionization promises a new and unique probe of the first billion year of the Universe.
- Many ongoing/planned global and interferometric experiments, but very difficult experiments.
- Dealing with the foregrounds is one of the major challenges of CD/EoR experiments.
- **Current Status:**
  - Claimed detection of the global signal (EDGES, -0.5K @  $z \sim 17$ )
  - Preliminary LOFAR deepest upper limits (based on ~5% of data):  
 $\Delta^2 < (100 \text{ mK})^2 @ k=0.1 \text{ cMpc}^{-1}, z \sim 9$
- **Perspectives:**
  - Very interesting upper limit is still at reach with LOFAR.
  - Confirm EDGES result with e.g. SARAS2 ...
  - Near future: AARTFAAC and NenuFAR exploring the Cosmic Dawn.
  - Far future: SKA promising tomography of the 21-cm signal.