

# Capturing the HI 21 cm Signal in Ground-Based Observations Amidst Diverse Systematic Influences

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**Cosmic Dawn at High Latitudes Conference**



# Contributors



Anshuman Tripathi  
(Final Year PhD Student)



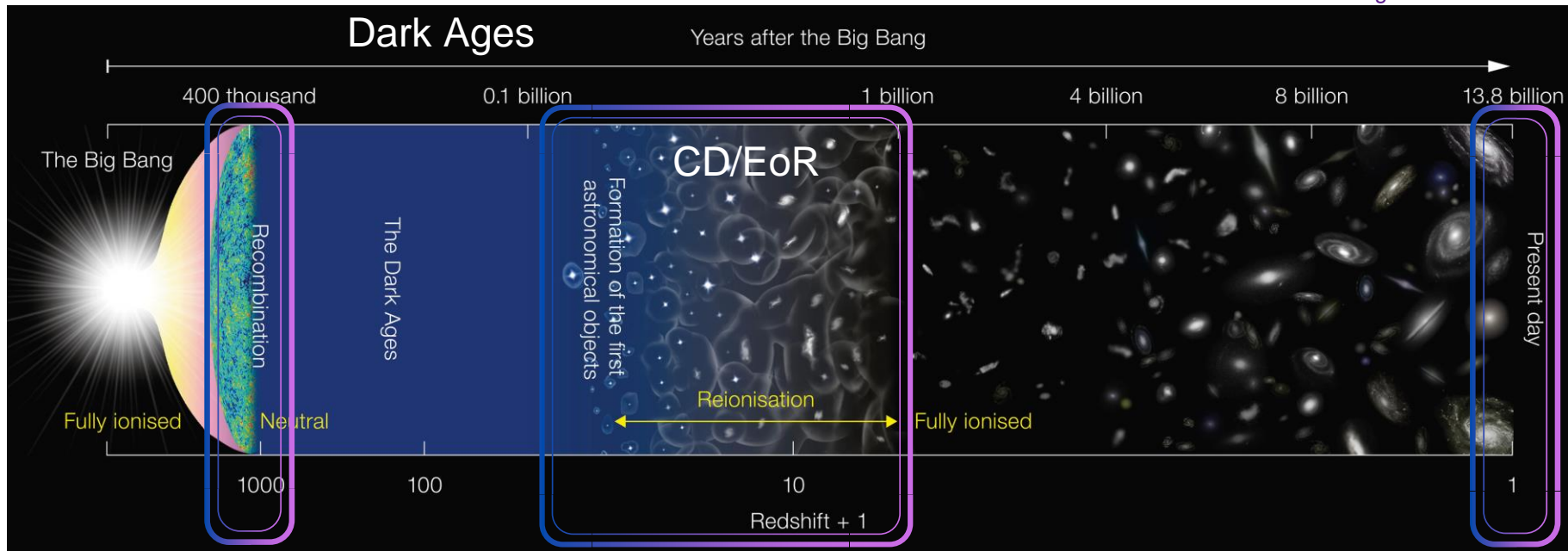
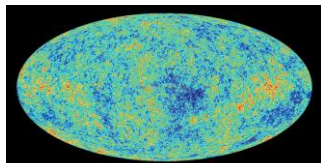
Samit K. Pal  
(Fourth Year PhD Student)



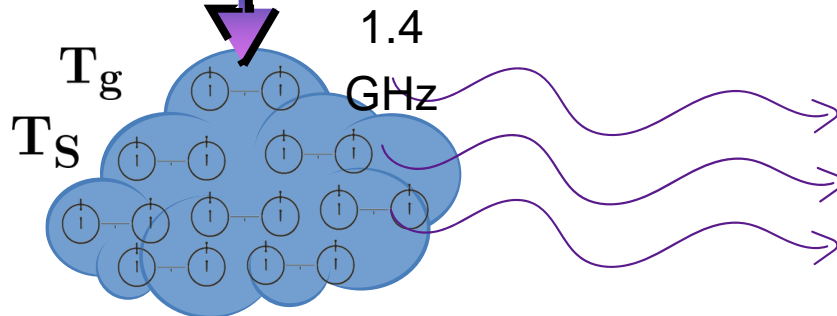
Rashmi Sagar  
(Fourth Year PhD Student)

## Dark Ages

Years after the Big Bang

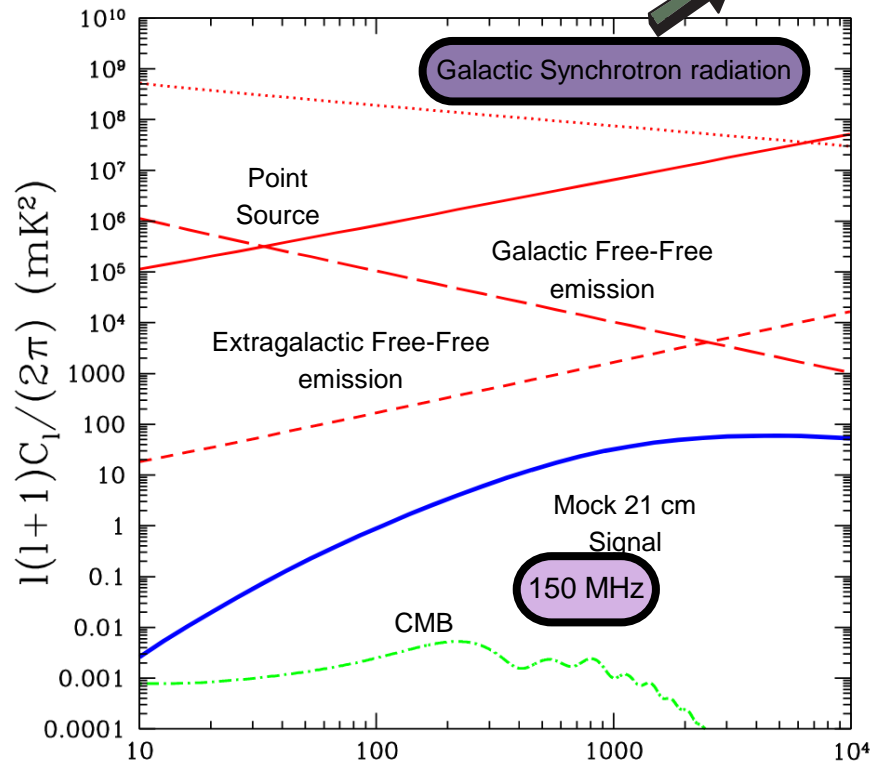
 $T_\gamma$ 

CMB

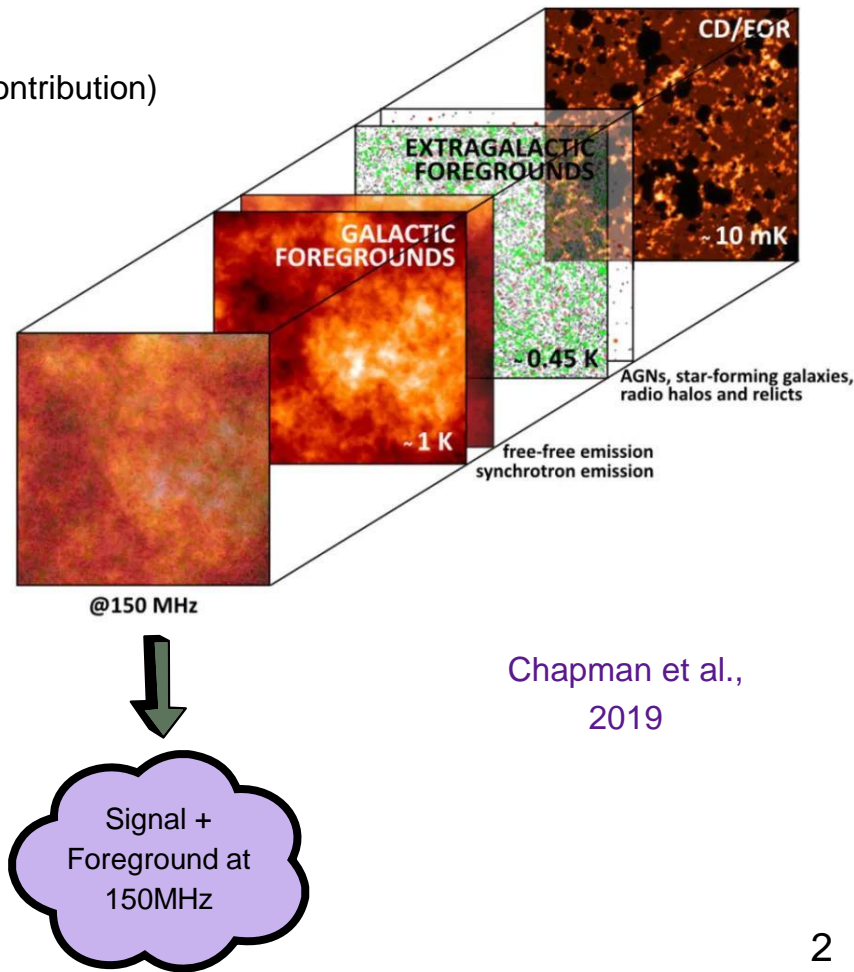


# Biggest Challenge : Foregrounds

Dominant ( ~ 70% Contribution)

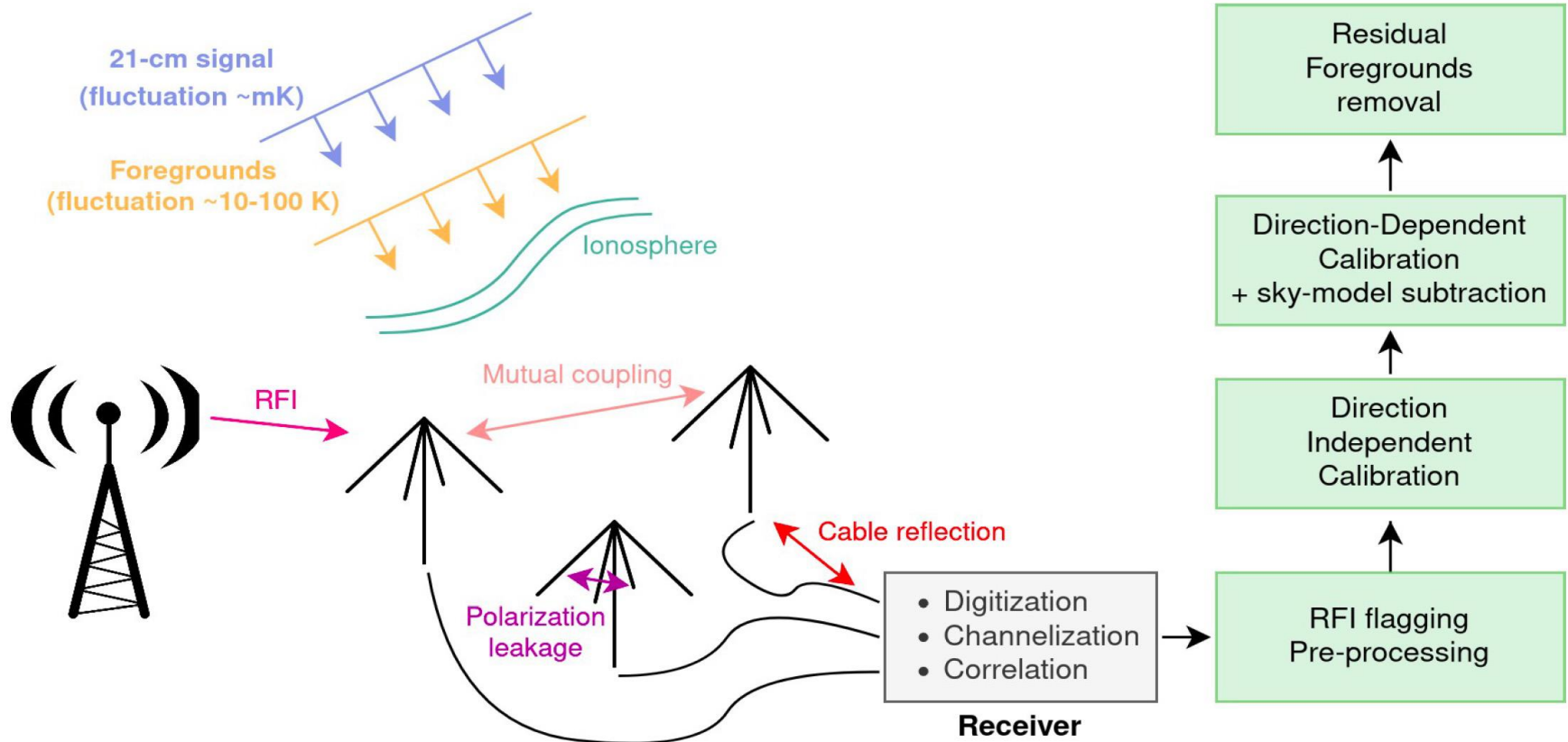


1 Santos et al.,



Chapman et al.,  
2019

# A challenging experiment



Courtesy: F. Mertens

## Motivation:

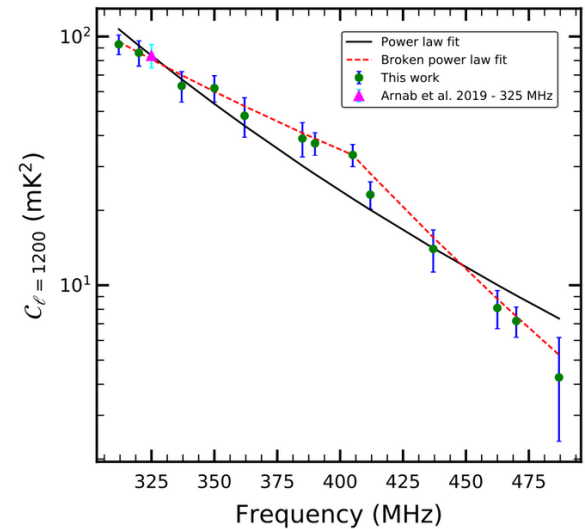
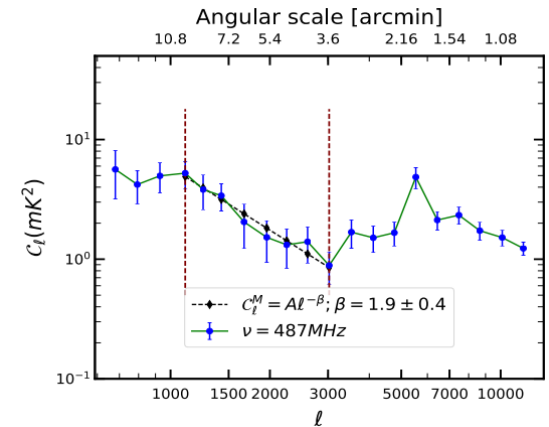
- ELAIS-N1 field is at high galactic latitudes.
- Characterization of diffuse radio background at 183MHz with uGMRT.

## Previous work in ELAIS N1 field :

- Performed direction-independent calibration in Band-3.
- The angular power spectrum using TGE.
- Upper limit in Band-3.

## NEW:

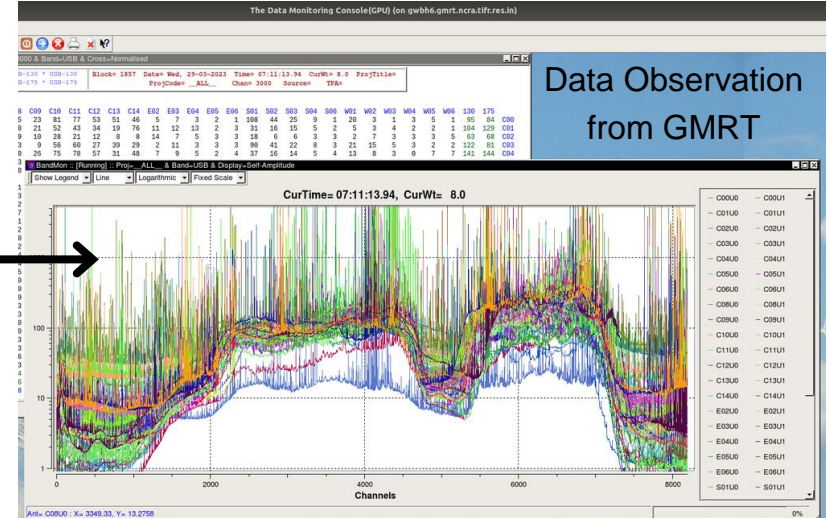
- **Direction-Dependent calibration** in Band-2.
- Power spectra estimation using **Image-based estimator**.
- Image-based estimator is promising tool to retrieve low multipoles at low-frequency.



## **Observations from uGMRT near 150 MHz**

# Observational INFO

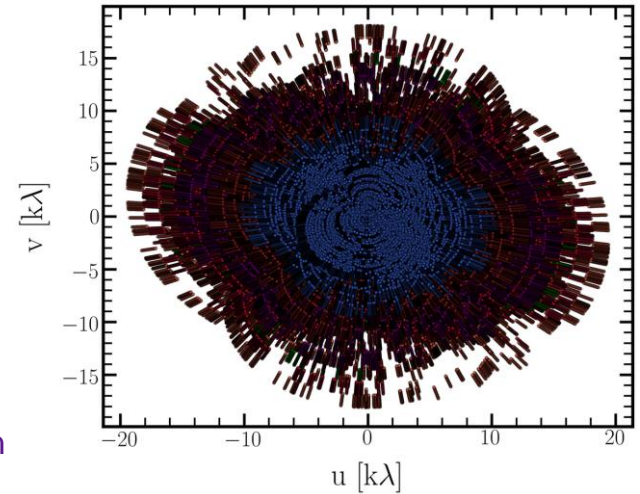
RFI & Noise



Total Observation Time	32 hours
Frequency	183MHz
Bandwidth	120 - 250 MHz
Integration Time	5.37sec
Number of Channels	8192
Frequency Resolution	24 KHz
Target field ( $\alpha, \delta$ ) <sub>2000</sub>	(16 <sup>h</sup> 10 <sup>m</sup> 1 <sup>s</sup> , +54°30'36")
Working Antennas	27

Pointing centres	13 <sup>h</sup> 31 <sup>m</sup> 08 <sup>s</sup> +30 <sup>d</sup> 30 <sup>m</sup> 32 <sup>s</sup> (3C286)
	15 <sup>h</sup> 49 <sup>m</sup> 17 <sup>s</sup> +50 <sup>d</sup> 38 <sup>m</sup> 05 <sup>s</sup> (J1549+506)
	16 <sup>h</sup> 10 <sup>m</sup> 01 <sup>s</sup> +54 <sup>d</sup> 30 <sup>m</sup> 36 <sup>s</sup> (ELAIS N1)
	01 <sup>h</sup> 37 <sup>m</sup> 41 <sup>s</sup> +33 <sup>d</sup> 09 <sup>m</sup> 35 <sup>s</sup> (3C48)

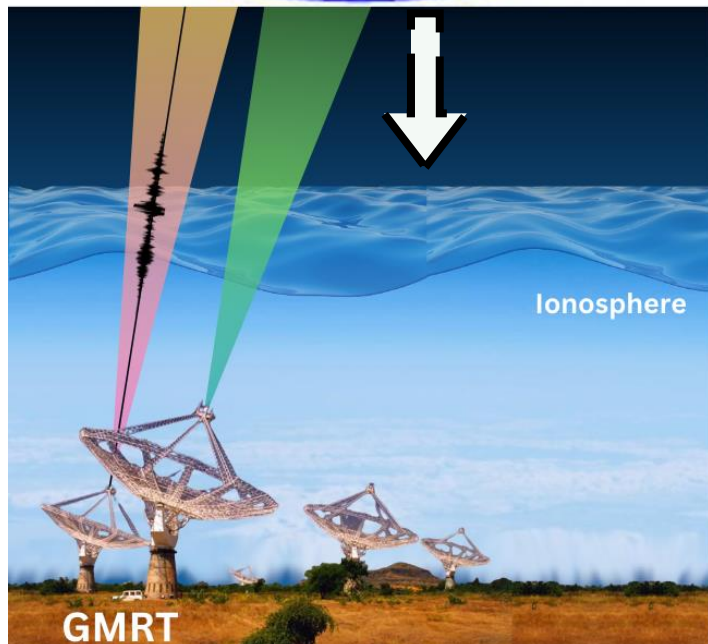
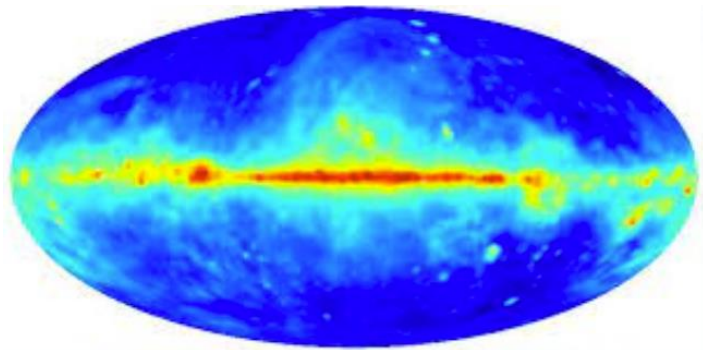
UV -  
coverage



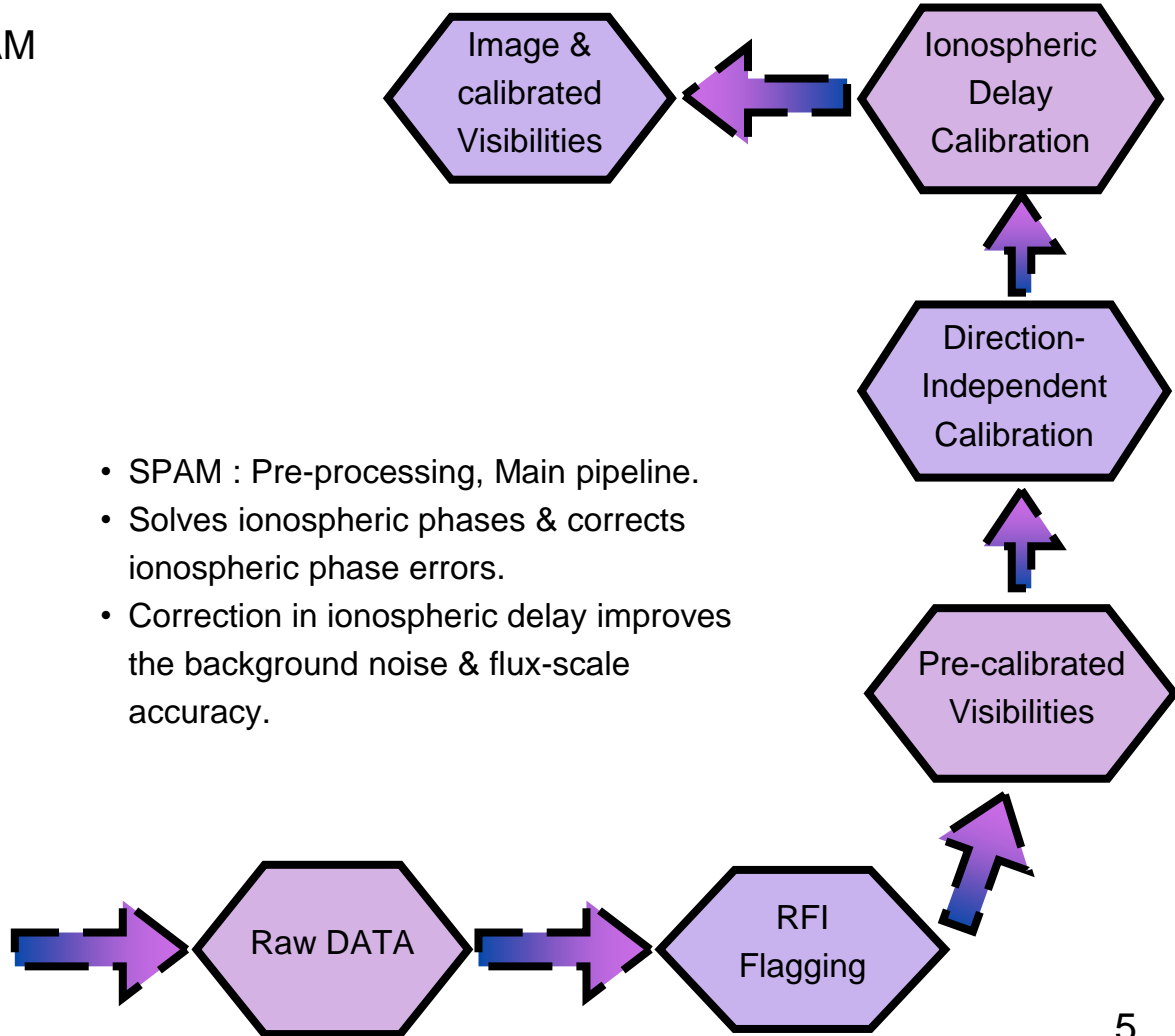
Sagar et al., ( In  
prep.)



## Direction-Dependent Calibration : SPAM

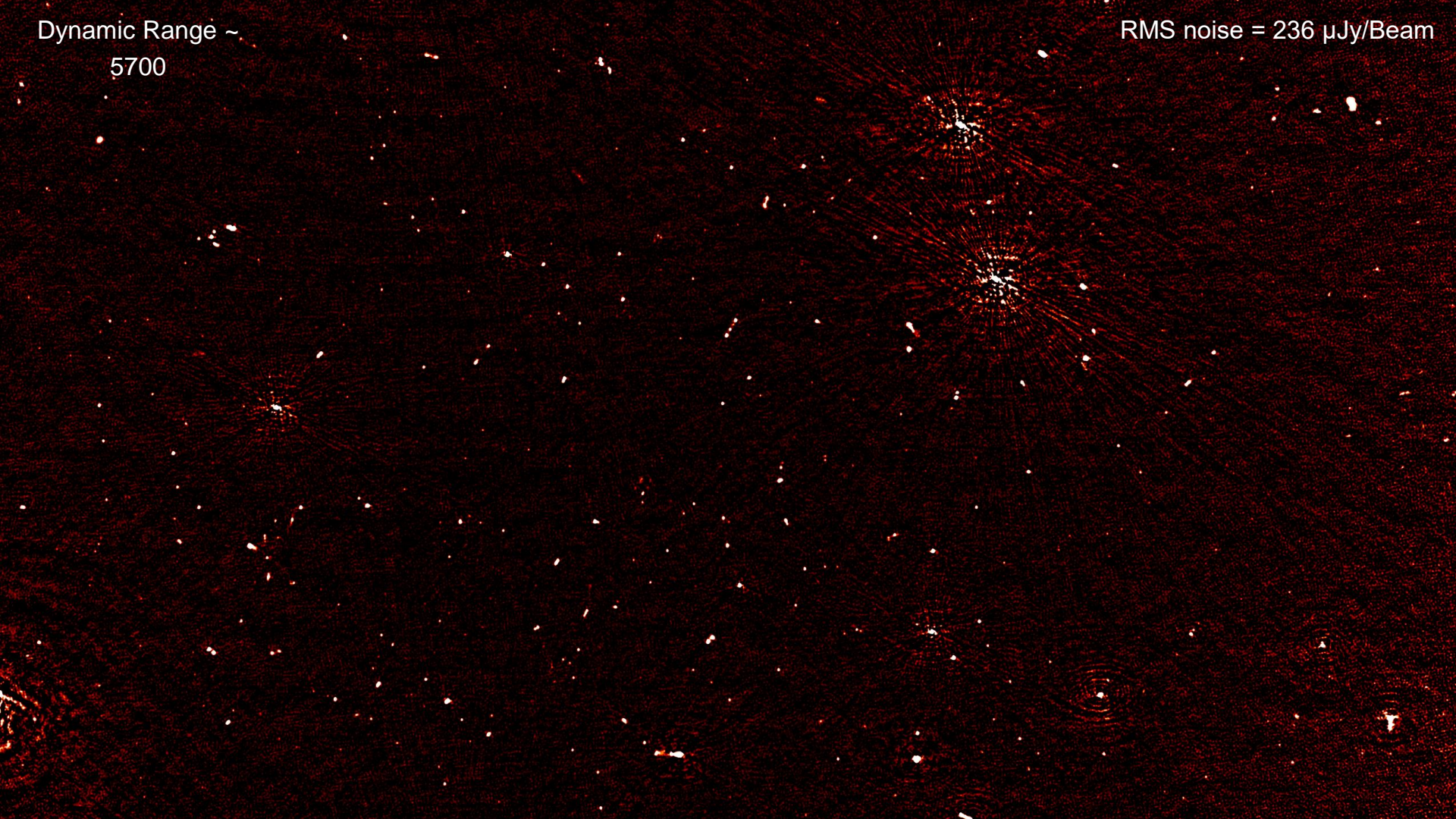


- SPAM : Pre-processing, Main pipeline.
- Solves ionospheric phases & corrects ionospheric phase errors.
- Correction in ionospheric delay improves the background noise & flux-scale accuracy.

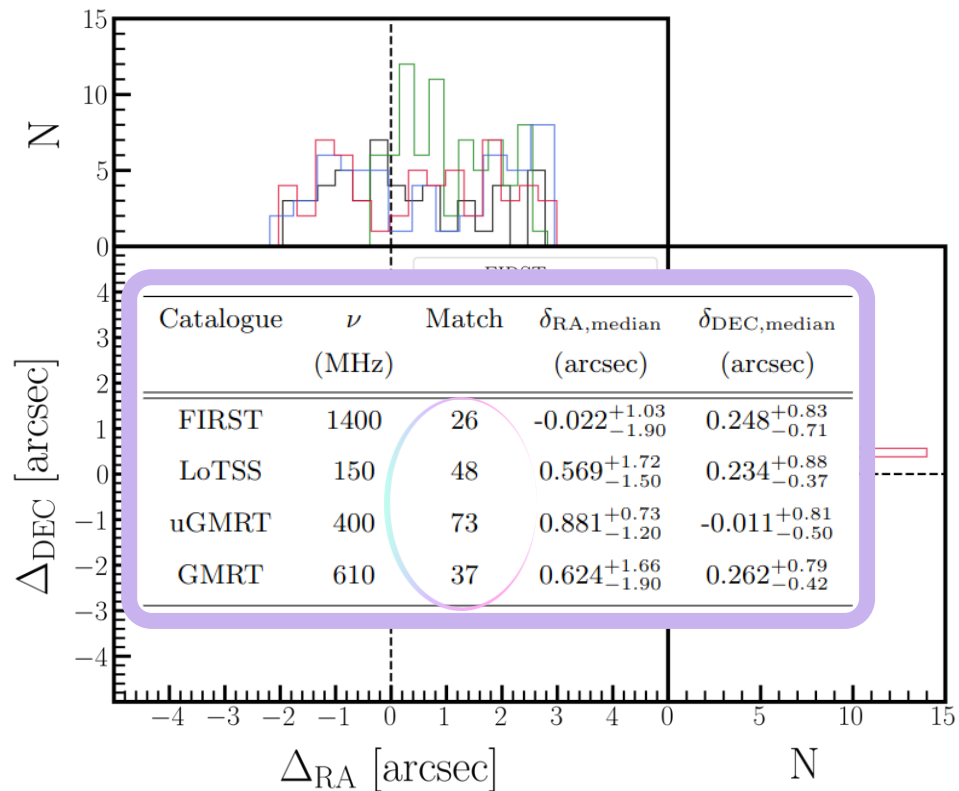
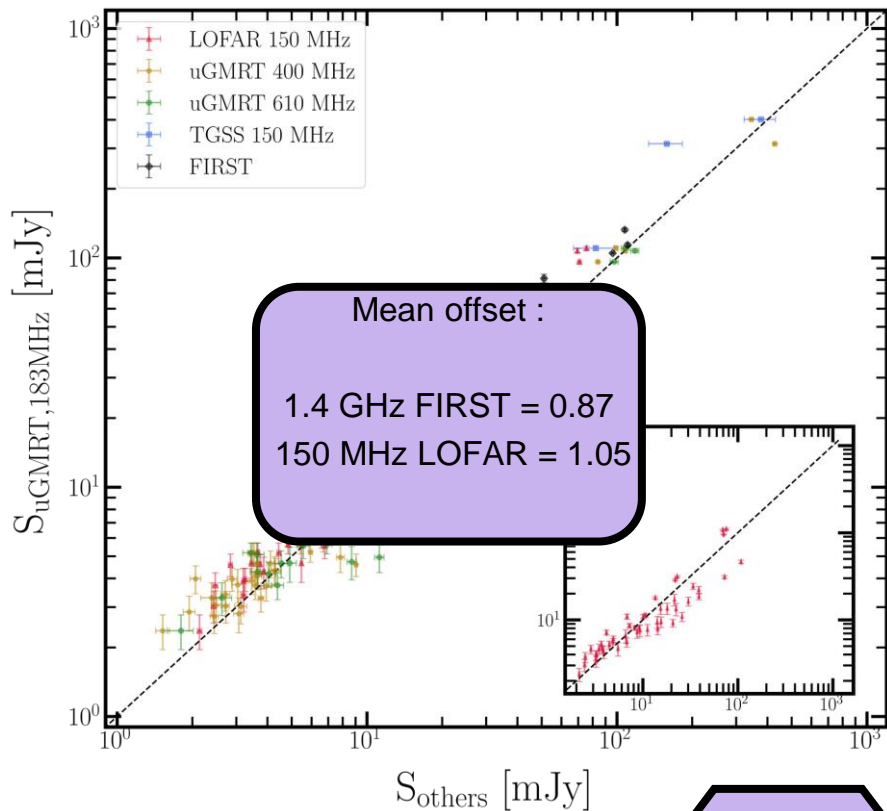


Dynamic Range ~  
5700

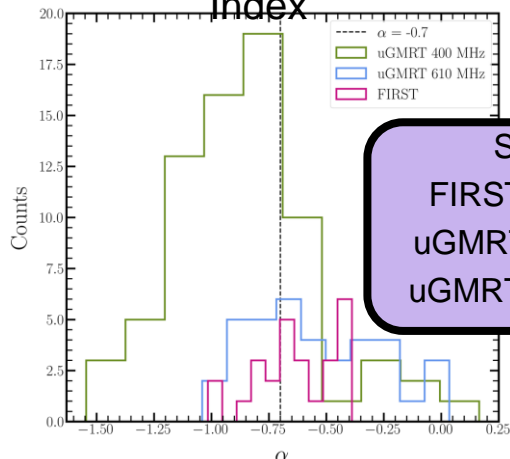
RMS noise = 236  $\mu$ Jy/Beam



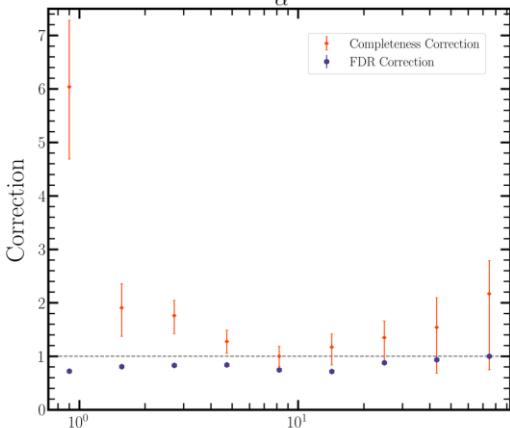
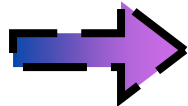
# Comparison with other catalog: Source catalog reliability



## Spectral Index



**Spectral Index**  
 FIRST 1.4 GHz = -0.63  
 uGMRT 400 MHz = -0.87  
 uGMRT 610 MHz = -0.57



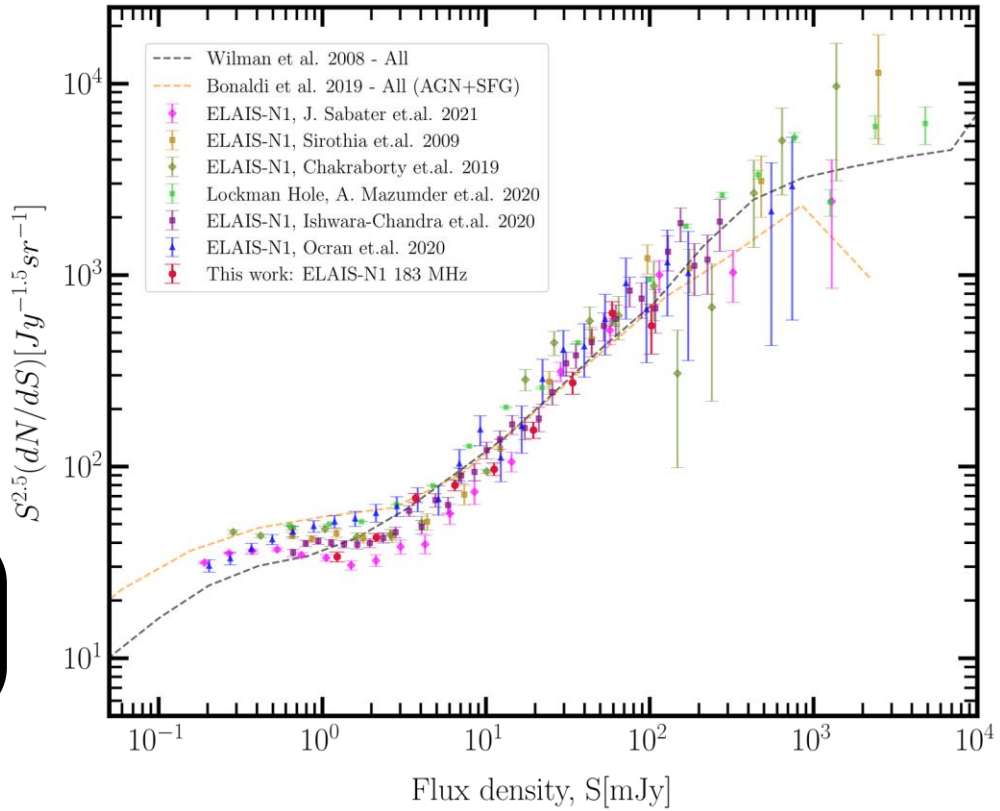
$$f_{\text{real},i} = \frac{N_{\text{catalog},i} - N_{\text{inv},i}}{N_{\text{catalog},i}}$$

$$\text{Correction}_{,i} = \frac{N_{\text{injected},i}}{N_{\text{recovered},i}}$$

Hale et al.  
2019

Correction for biases

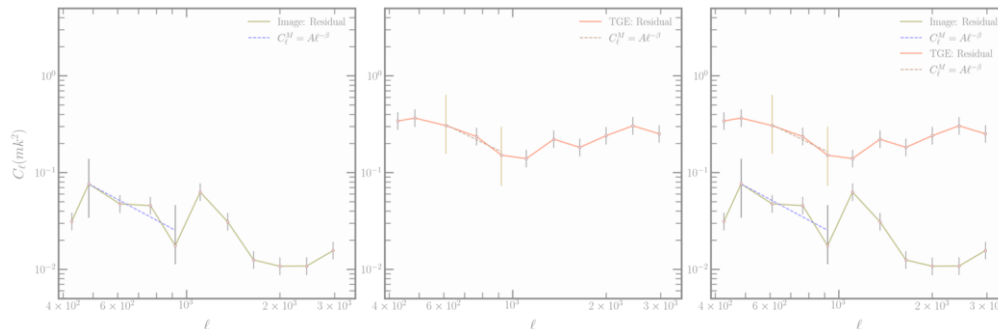
## Source Counts



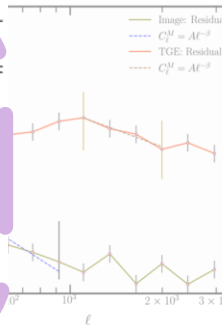
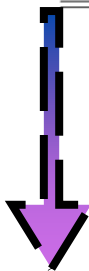
Sagar et al., ( In prep.)

# Angular Power Spectrum : BAND-3

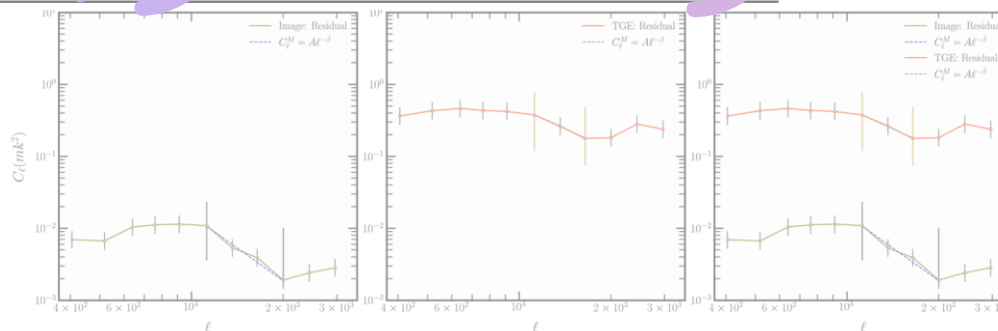
416MH  
Z



$\nu$ (MHz)	i-APS			t-APS		
	$A$ ( $mK^2$ )	$\beta$	$\ell_{min} - \ell_{max}$	$A$ ( $mK^2$ )	$\beta$	$\ell_{min} - \ell_{max}$
316	$1.487 \pm 0.111$	$2.102 \pm 0.331$	419 – 918	$1.087 \pm 0.029$	$1.779 \pm 0.120$	751 – 1114
350	$0.540 \pm 0.026$	$2.961 \pm 0.325$	400 – 621	$0.472 \pm 0.039$	$1.888 \pm 0.464$	621 – 755
383	$0.382 \pm 0.018$	$2.726 \pm 0.189$	507 – 909	$0.174 \pm 0.028$	$2.353 \pm 0.366$	620 – 909
416	$0.114 \pm 0.023$	$2.108 \pm 0.557$	483 – 919	$0.144 \pm 0.020$	$1.562 \pm 0.341$	609 – 919
450	$0.021 \pm 0.005$	$2.920 \pm 0.594$	514 – 919	$0.328 \pm 0.019$	$1.574 \pm 0.179$	1105 – 1993
483	$0.332 \pm 0.001$	$3.016 \pm 0.334$	481 – 730	$0.471 \pm 0.009$	$1.935 \pm 0.071$	1121 – 2007



483MH  
Z



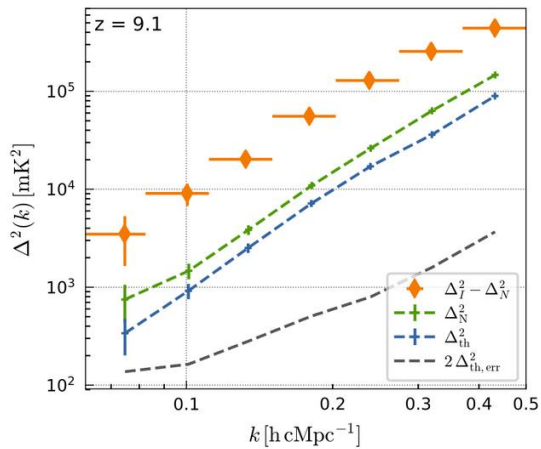
# Upper limit on 21-cm signal with other telescopes at High - z

Reionization epoch ( $z > 6$ )

HERA Phase I

Abdurashidova et al., 2022

Band 1 ( $z = 10.4$ ) and Band 2 ( $z = 7.9$ )

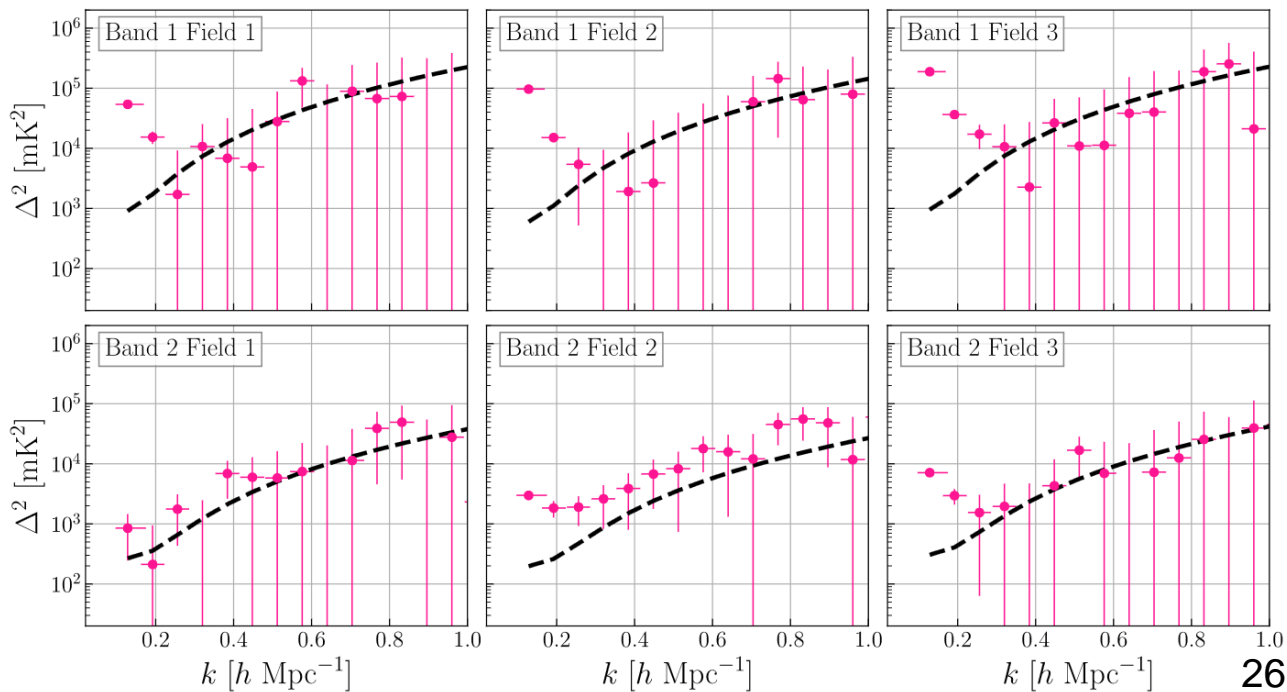


LOFAR

$z \approx 9.1$

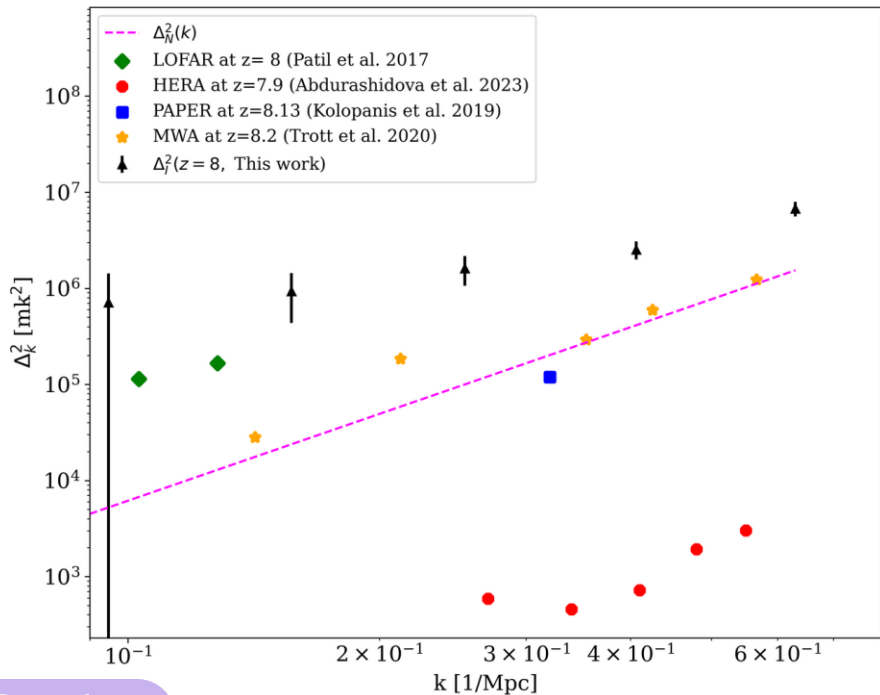
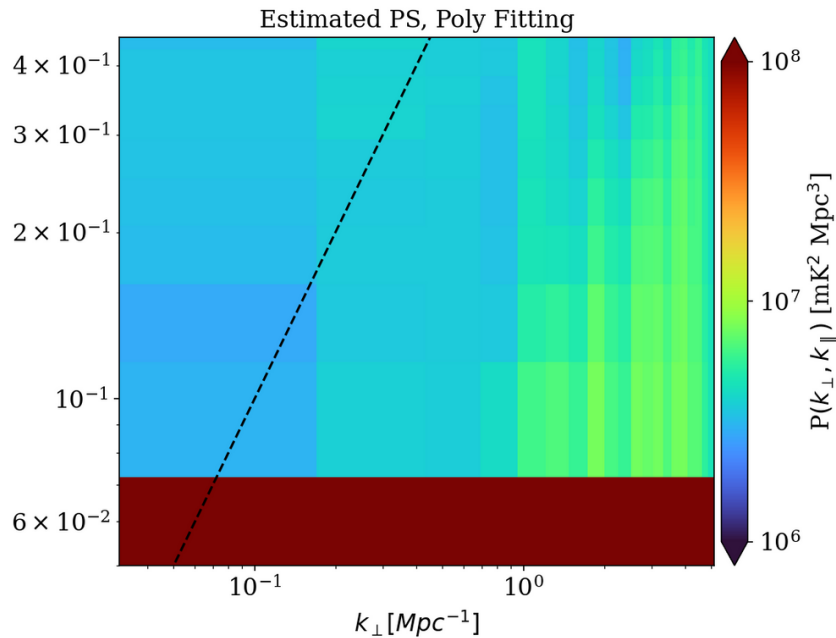
Mertens et al.,

2020



# Estimated PS using Polynomial Fitting (order $n = 3$ ) from point source subtracted data

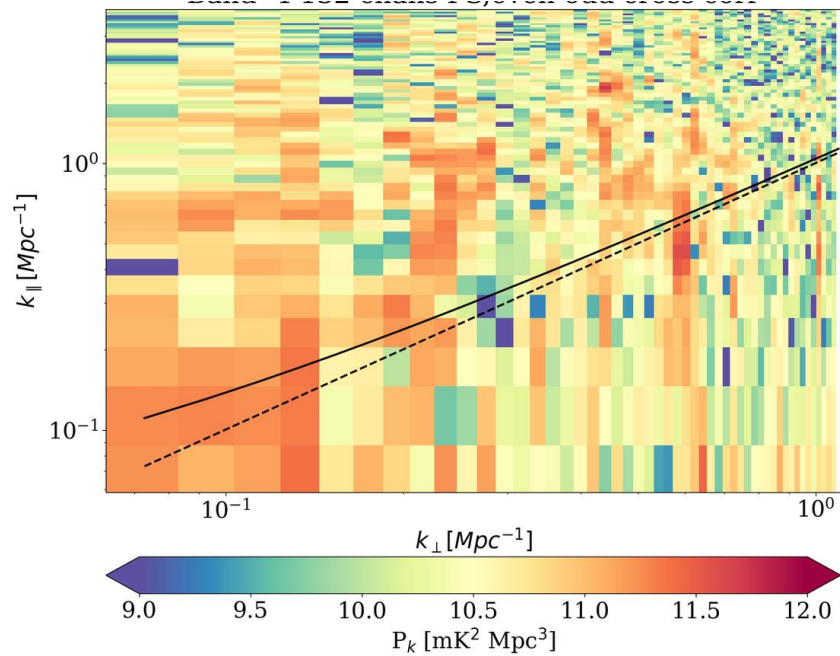
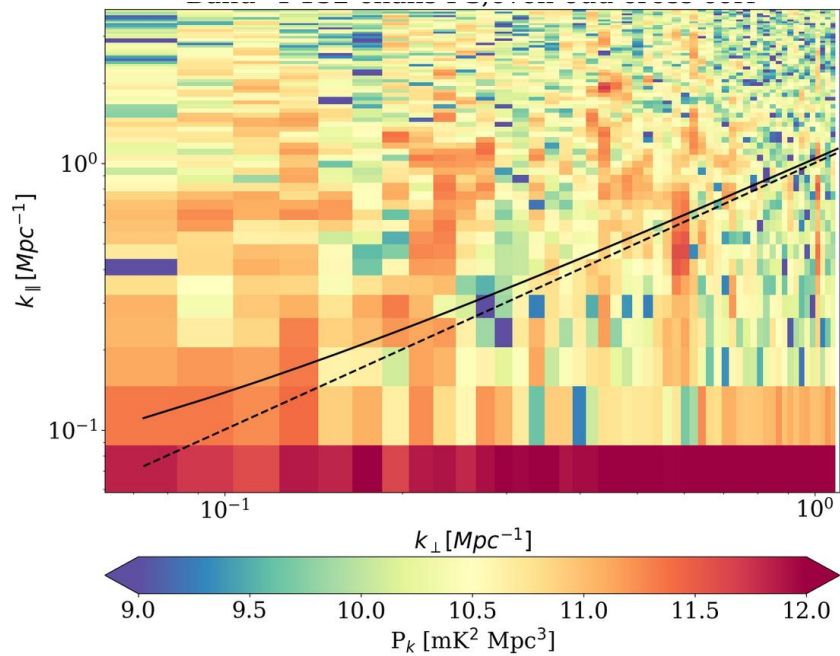
Image area = central 2.8x2.8 degrees  
Bandwidth ~ 14.6 MHz  
Observation Time ~ 8 hour



Initial Results

# Estimated PS for point source and residual data

Image area = central 2.8x2.8 degrees  
Bandwidth ~ 6.6 MHz  
Observation Time ~ 8 hour





Dynamic Range ~  
10,000

RMS noise = 120  $\mu$ Jy/Beam

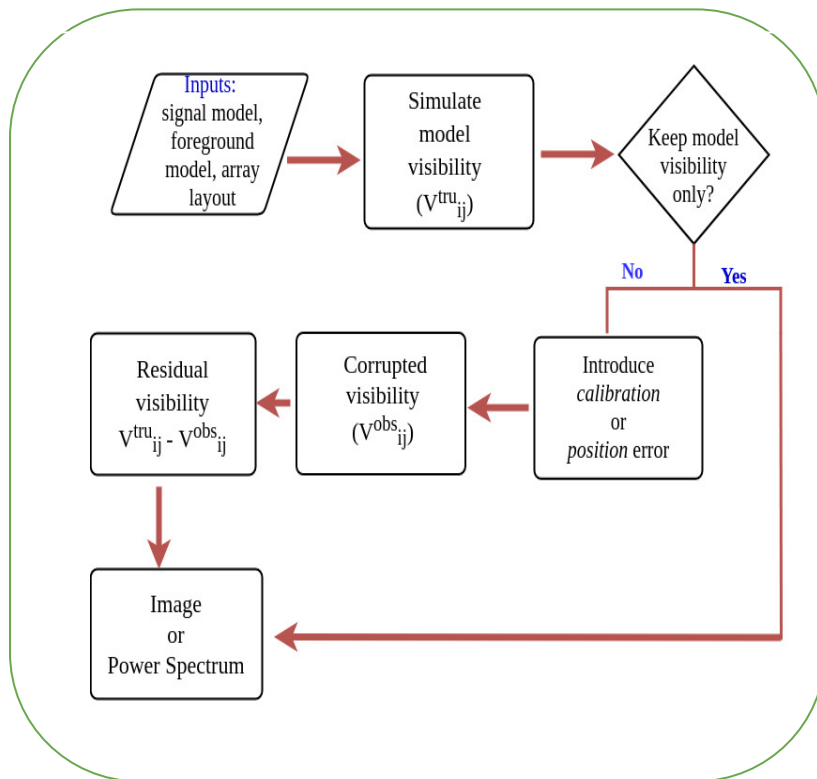
1622

## **Understanding Systematics:**

**Development of 21cmE2E Pipeline for DI and DD calibration Errors from visual observation of 2D and 1D PS**

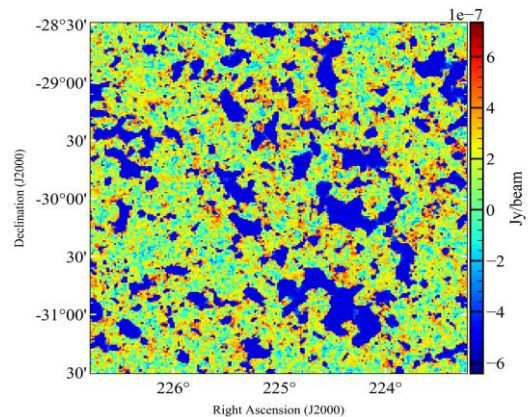
# Flowchart: Observational Pipeline - 21cmE2E

- In [A. Mazumder et al. 2022](#), they have developed the 21cmE2E pipeline to simulate interferometric observation.

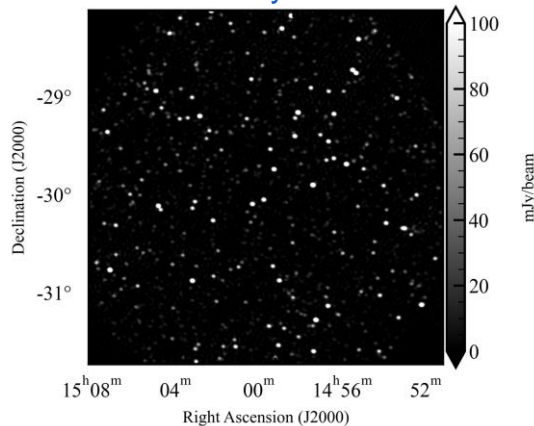


# Simulation inputs for the Synthetic Observation

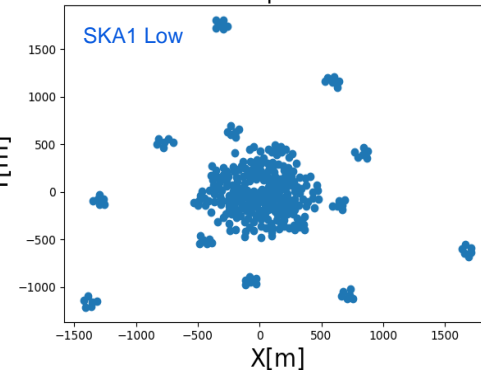
21cm Signal



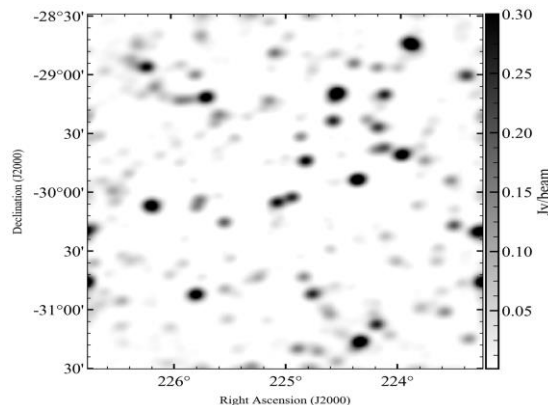
Global sky model



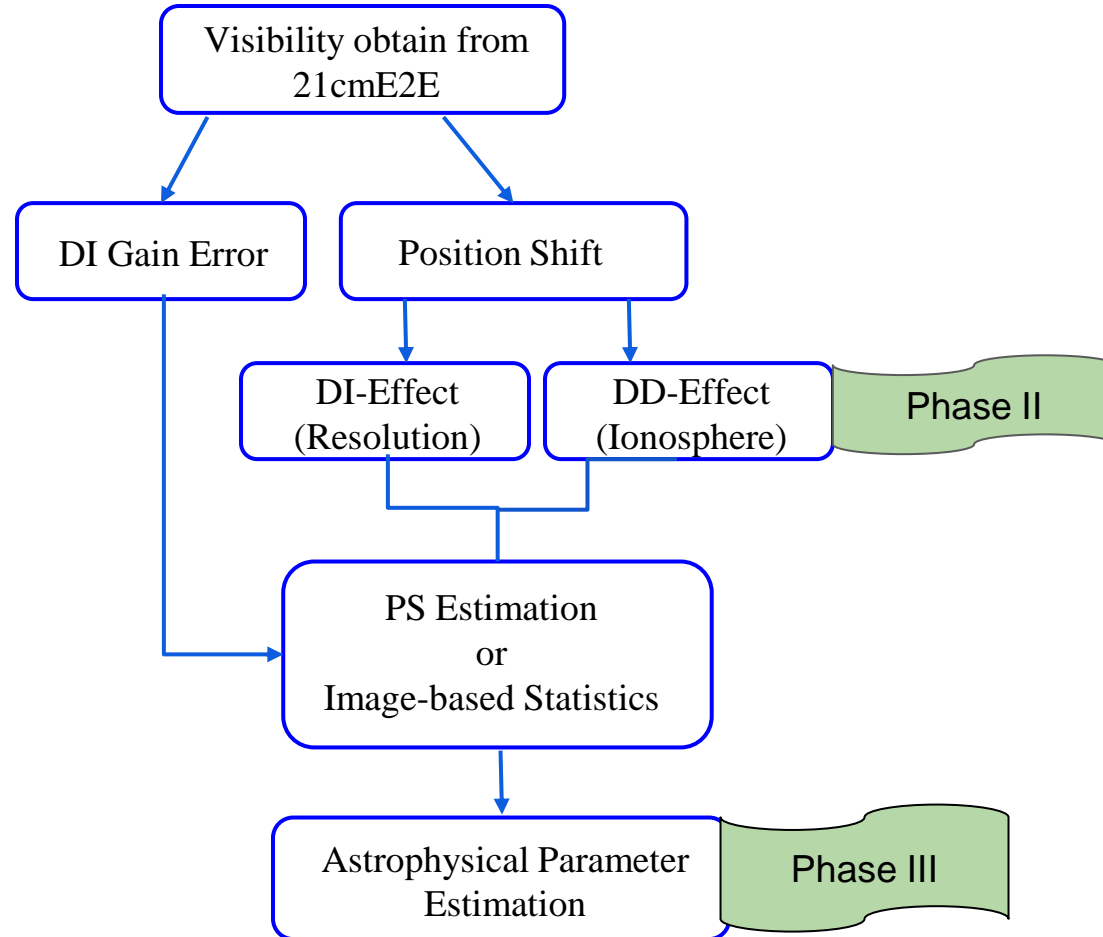
Telescope Model



Parameter	Value
Central Frequency	142 MHz ( $z \sim 9$ )
Bandwidth	8 MHz
Number of frequency channels	64
Field of view	4°
Number of array elements:	
SKA1-Low Core	296
Maximum baseline (m):	2000
Synthesised beam (arcmin):	2.5

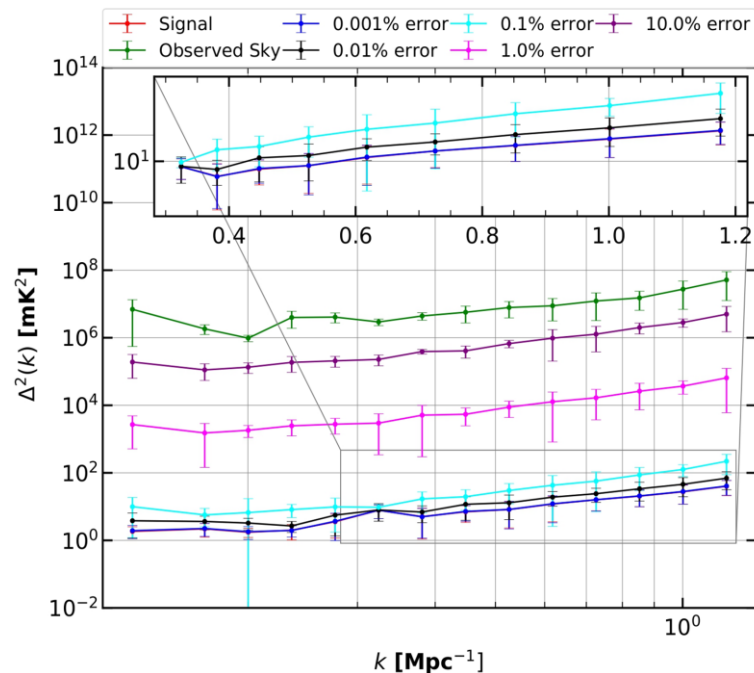
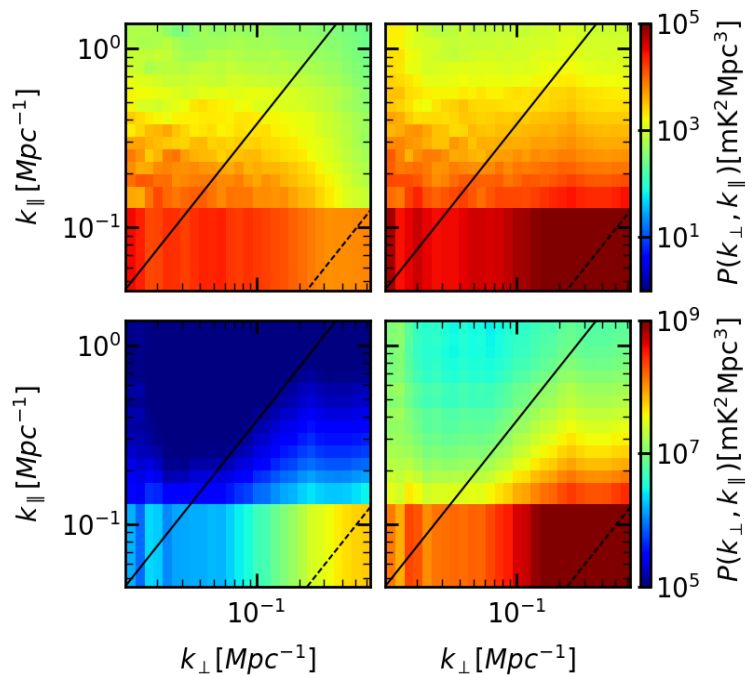


# Utility of this Observation Pipeline for Various Scientific Case Studies

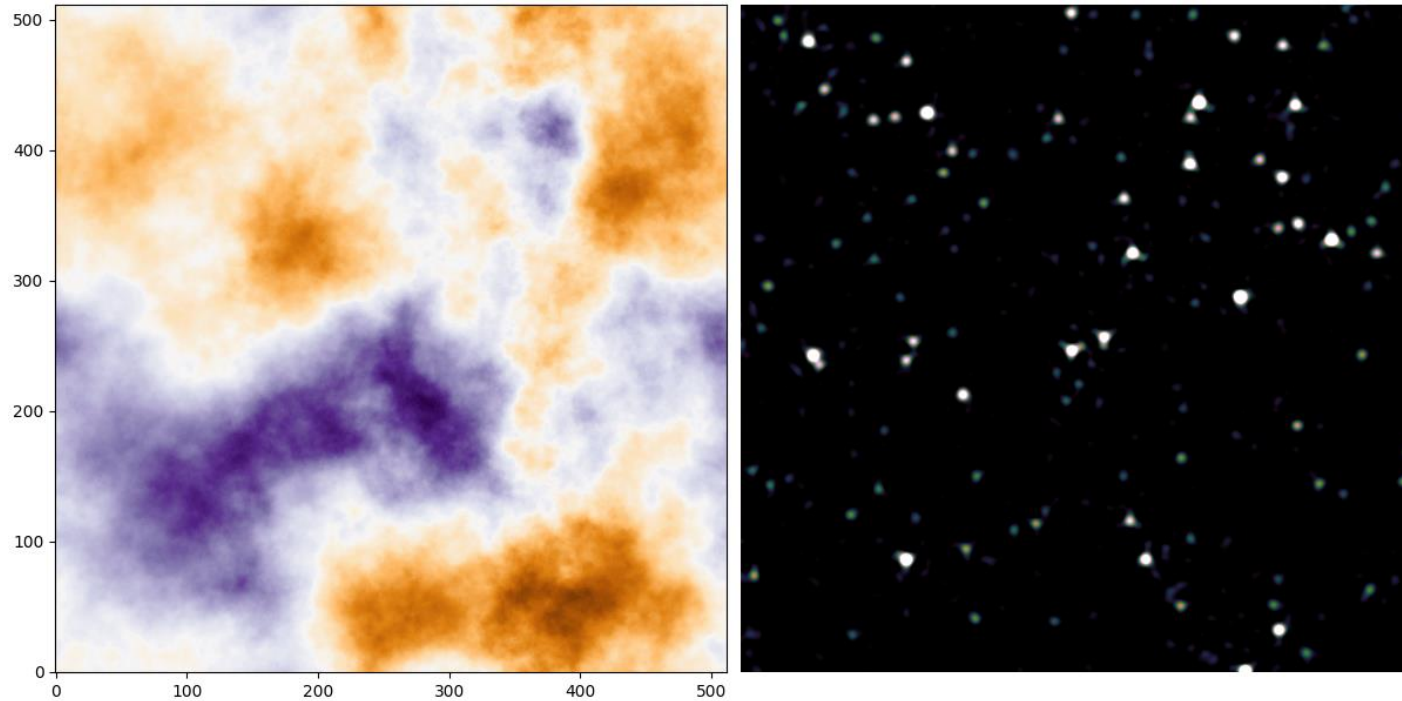


# Power Spectrum Estimation : DI Gain Calibration Error

- Power spectrum analysis - Spherical averaged PS follows signal power if residual calibration error is  $> 0.1\%$  is exceeds signal power significantly for greater error



# Effect of ionosphere on Radio Observation



**Animation of source offset in presence of Kolmogorov turbulence**

# Ionosphere activity on Murchison Radio-astronomy Observatory location

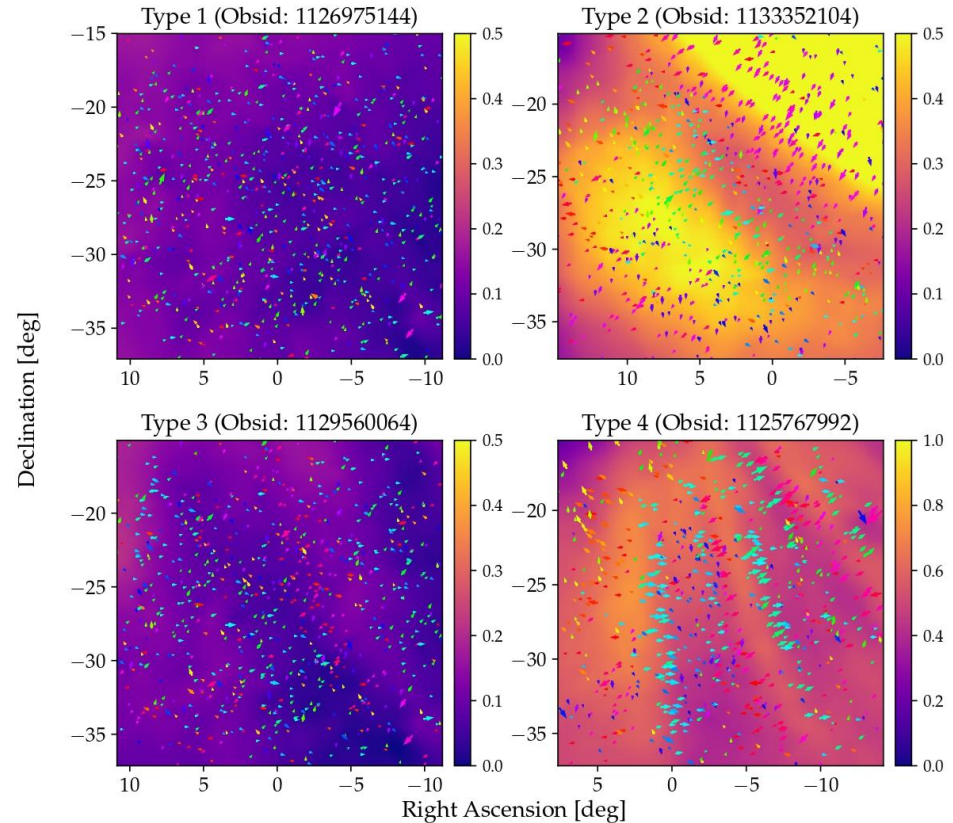
- 4 main ionosphere activity types categorized at MRO location based on apparent position shift and spatial structure.

[Jordan et. al. 2017](#)

- Galactic and Extragalactic All-Sky MWA Survey shows the the angular scales of the ionospheric structure are typically 100 km.

[Helmholtz & Hurley-Walker et. al., 2020](#)

- Ionospheric activity - simulated extremely quiet to active condition.
- **Median ionospheric offset (MIO)** - quantifying metric of ionospheric activity.





# Ionospheric Models : Refractive Shift

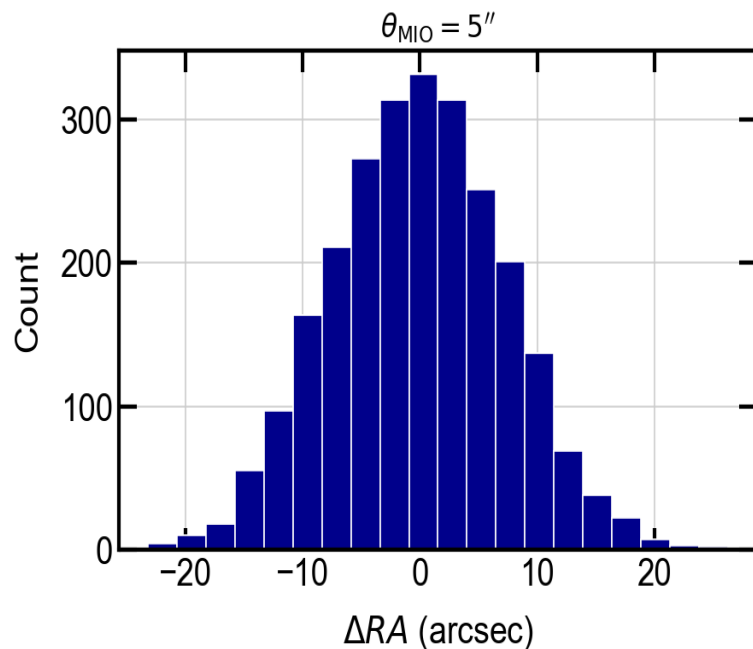
- ❑ Apparent position shift added to each source along RA direction using Gaussian distribution.
- ❑ The ionospheric activities are simulated are comparable in real MWA observation based on [Jordan et al. 2017](#).
- ❑ Apparent position offset of the cosmic sources :

$$\vec{\nabla}TEC = 1.20 \times 10^{-4} \left( \frac{f}{100MHz} \right)^2 \left( \frac{\vec{\delta}\theta}{1''} \right) TECU km^{-1}$$

[Helmboldt & Hurley-Walker et al., 2020](#)

- ❑ For each timestamp of 2 minutes, the local structure remains the same and consistent.

[Wayth et al. 2015](#)



# Ionospheric Models: Kolmogorov Turbulence Model

- ❑ The power spectrum of the spatial phase function is

$$|\Phi(\vec{k})|^2 \propto \left[ k^2 + \left( \frac{1}{L_0} \right)^2 \right]^{-\alpha/2} \exp\left( -\frac{k^2}{2/l_0^2} \right); 1/L_0 \ll k \ll 1/l_0$$

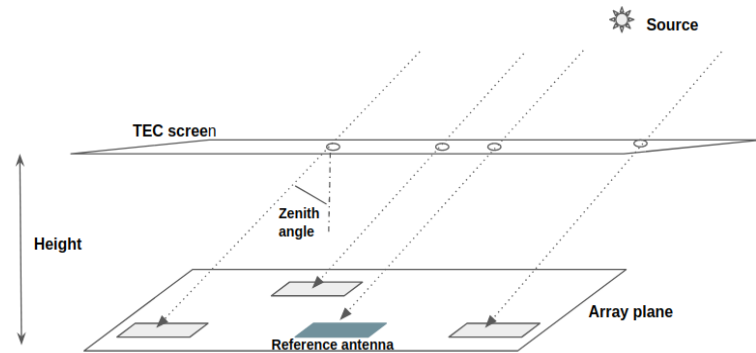
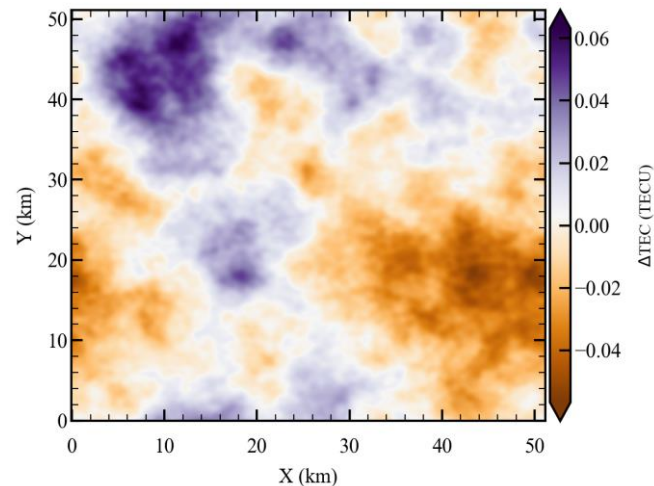
- ❑ Time evolving phase screen -

$$\Phi_{new}(\vec{k}) = \Phi_{old}(\vec{k}) \exp\left( 2\pi i \vec{k} N_s / N \right)$$

[Glindemann et al., 2007](#)

- ❑ For each timestamp of 2 minutes, the local structure remains the same and consistent.

[Wayth et al. 2015](#)

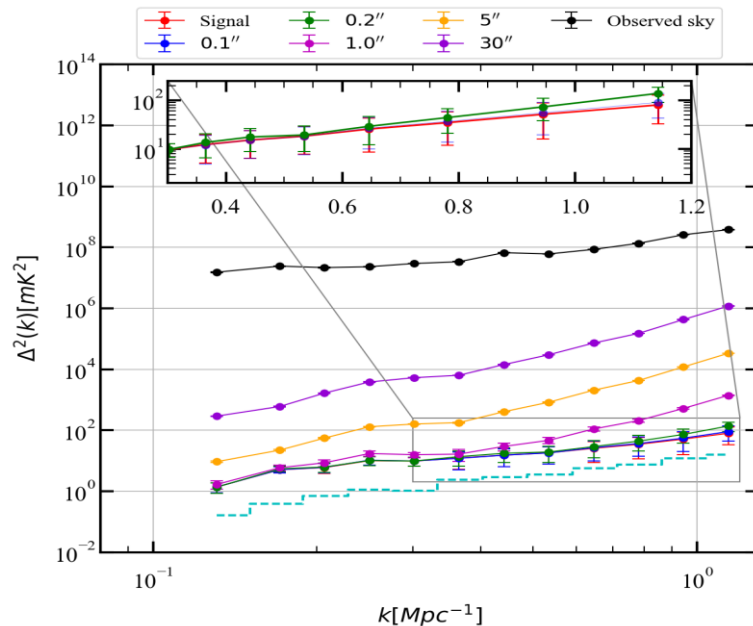
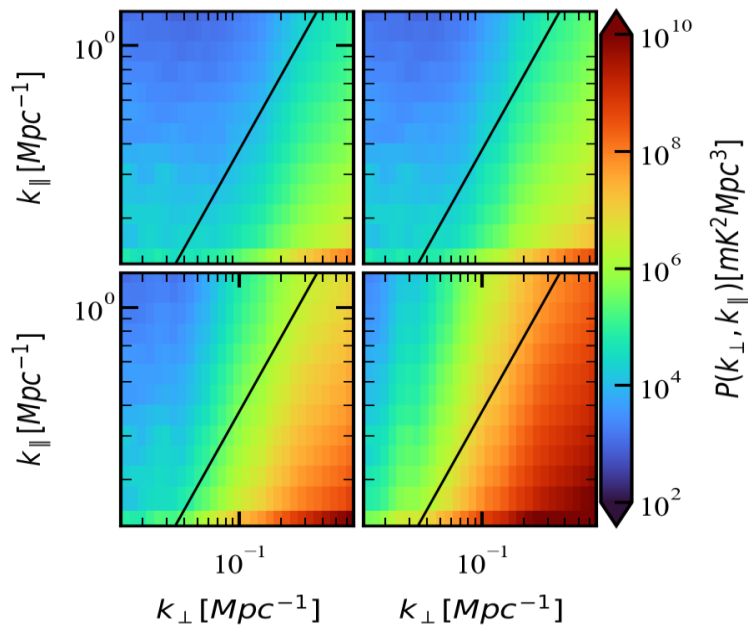


Schematics representation of Earth's Ionosphere

Image Credit: [Chage et al., 2021](#)

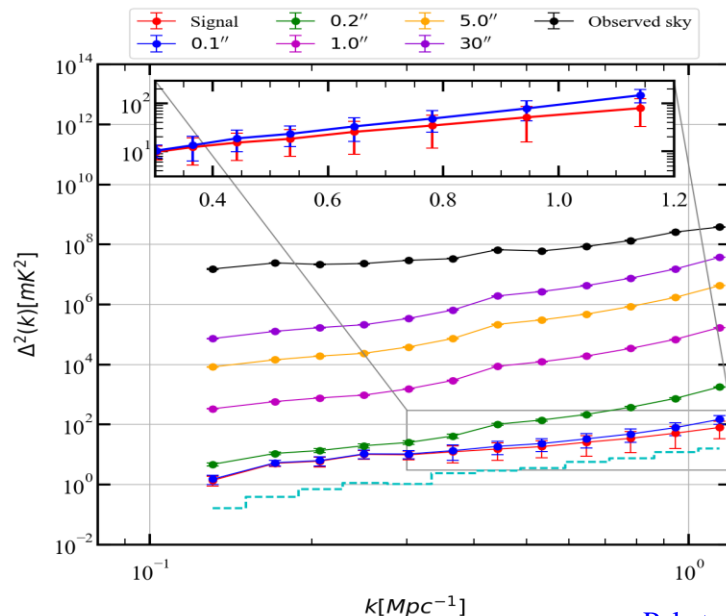
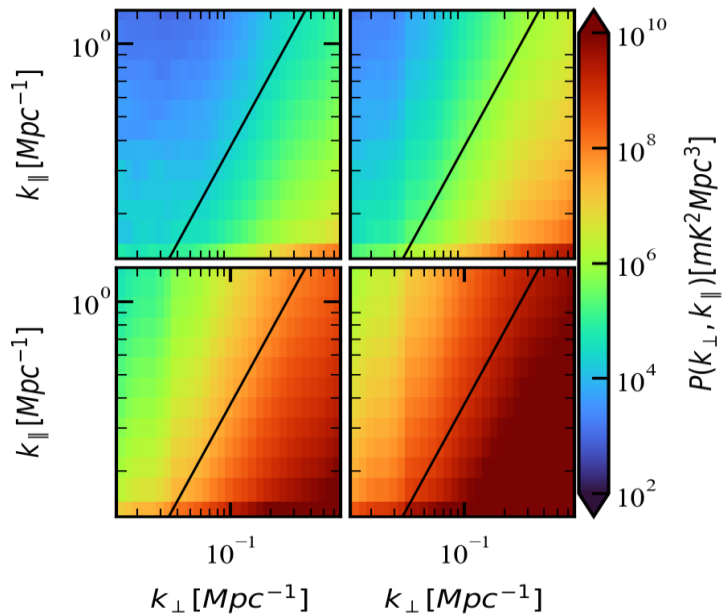
# Power Spectrum Estimation : Refractive Shift

- ❑ Foreground leakage to the EoR window with increasing source displacement.
- ❑ Power spectrum analysis - Spherical averaged PS follows signal power if sources are displaced by ionospheric median offset of 0.2 arcsec , greater error lead to higher amplitude of residual power wrt signal power.



# Power Spectrum Estimation : Kolmogorov Turbulence

- ❑ Foreground leakage to the EoR window with increasing source displacement.
- ❑ Power spectrum analysis - Spherical averaged PS follows signal power if sources are displaced by ionospheric median offset of 0.1 arcsec , greater error lead to higher amplitude of residual power wrt signal power.
- ❑ Beyond the 0.1 arcsec, residual power surpasses the target signal PS across all accessible  $k$ -modes

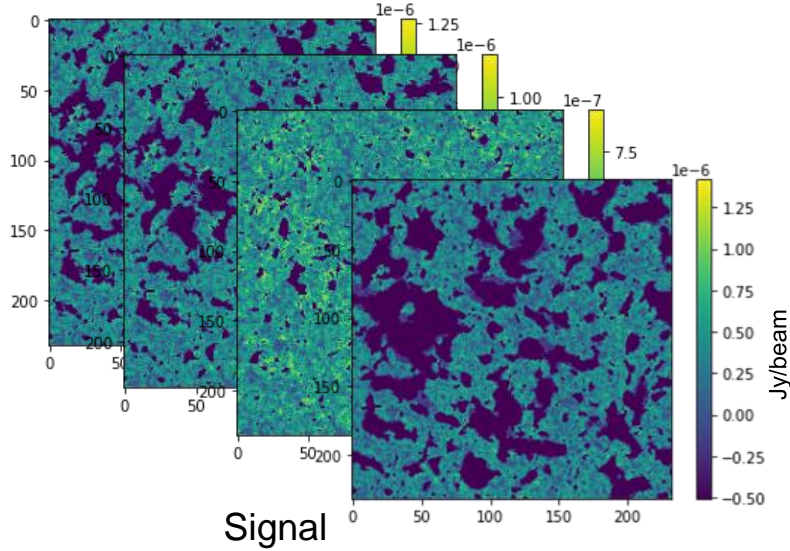


# Summary/Takeaways

- ❑ We assess the effects of different ionospheric conditions ranging from quiet to extreme conditions.
- ❑ We observed that depending on the specific type of disturbance induced, ionospheric corruption significantly affects the recovery of the target signal in the k-scales .
- ❑ For the case of a time-varying phase offset, if sources are shifted by up to  $0.2''$  on average, the HI power spectrum is recoverable.
- ❑ The most realistic turbulent condition generated using Kolmogorov's statistics shows that beyond  $\sim 0.1''$  , residual power is too high for 21 cm signal recovery.
- ❑ These results indicate that understanding the ionospheric conditions during observation runs for EoR science is essential since such unaccounted effects, even to first order, can adversely affect signal recovery.

**Extracting the 21-cm Power Spectrum and associated parameters  
With DI Calibrated Gain Error**

# Training Data sets



## Parameters Ranges

$R_{\text{mfp}} = 10 \text{ Mpc to } 60 \text{ Mpc}$

$\zeta = 10 \text{ to } 60$

$T_{\text{vir}} = 4.5 \text{ to } 6.0 \text{ (in dex)}$

(H.Shimabukuro et al. 2017)

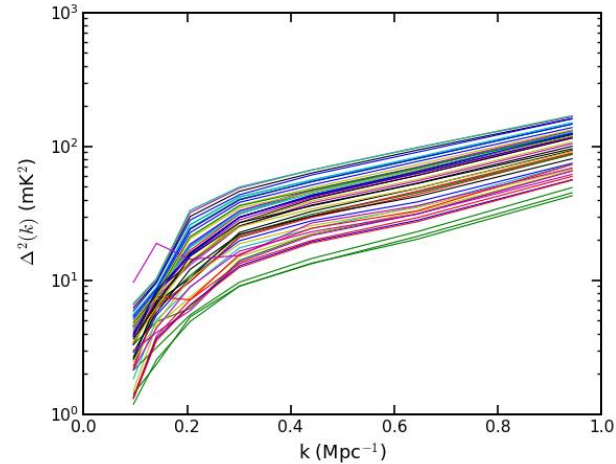
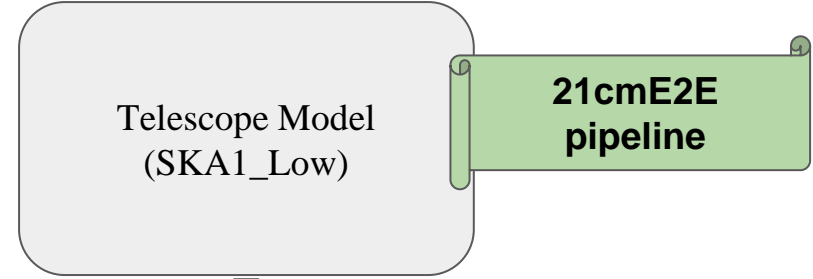
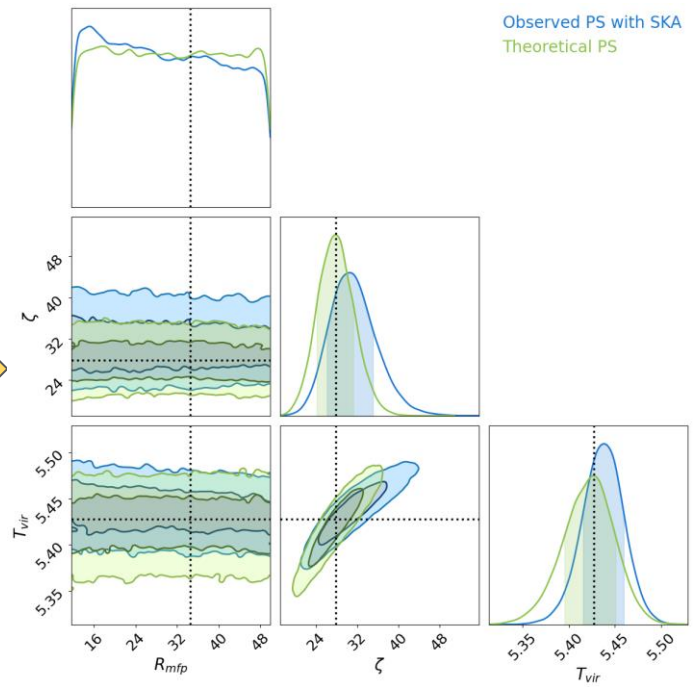
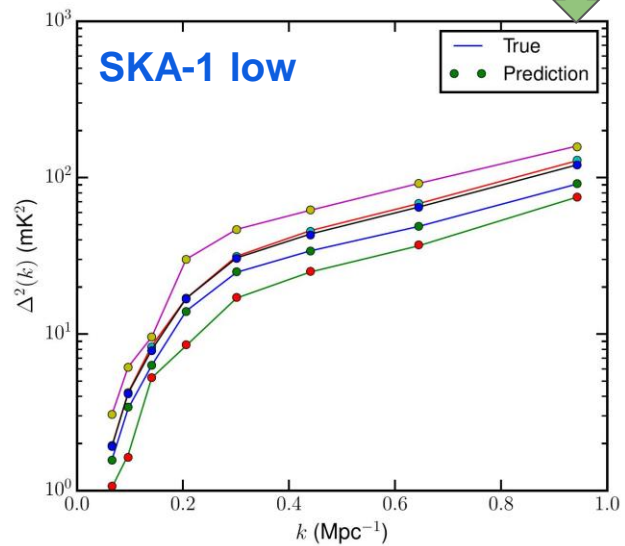
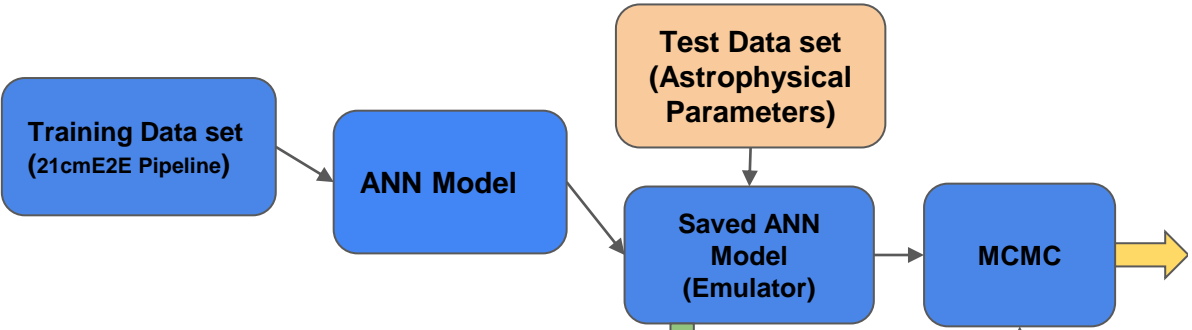


Fig : 300 datasets of the HI Power spectrums for the training.

# Emulating Power Spectrum and Parameter Extraction



Parameters	True Value	Observed PS with SKA1 low (MCMC)
$R_{mfp}$	34.67	—
$\zeta$	27.92	$31.6^{+5.2}_{-4.0}$
$T_{vir}$	5.428	$5.439^{+0.021}_{-0.021}$



# MCMC Prediction for different Astrophysical Conditions

	Parameters	True Value	Observed PS with SKA1 low (MCMC)
PS1 {	$R_{mfp}$	34.67	–
	$\zeta$	27.92	$31.6^{+5.2}_{-4.0}$
	$T_{vir}$	5.428	$5.439^{+0.021}_{-0.021}$
PS2 {	$R_{mfp}$	12.2	$20.0^{+14.1}_{-8.2}$
	$\zeta$	18.42	$20.0^{+4.9}_{-3.9}$
	$T_{vir}$	4.738	$4.764^{+0.034}_{-0.047}$
PS3 {	$R_{mfp}$	44.33	–
	$\zeta$	57.42	$59.8^{+0.0}_{-9.3}$
	$T_{vir}$	5.928	$5.926^{+0.013}_{-0.013}$

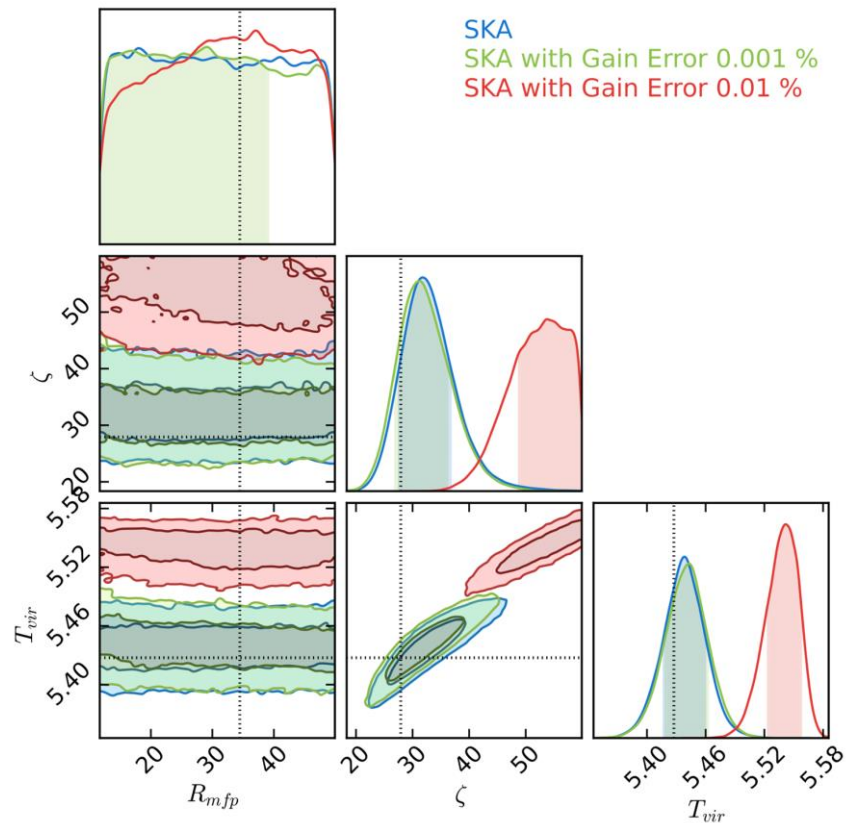
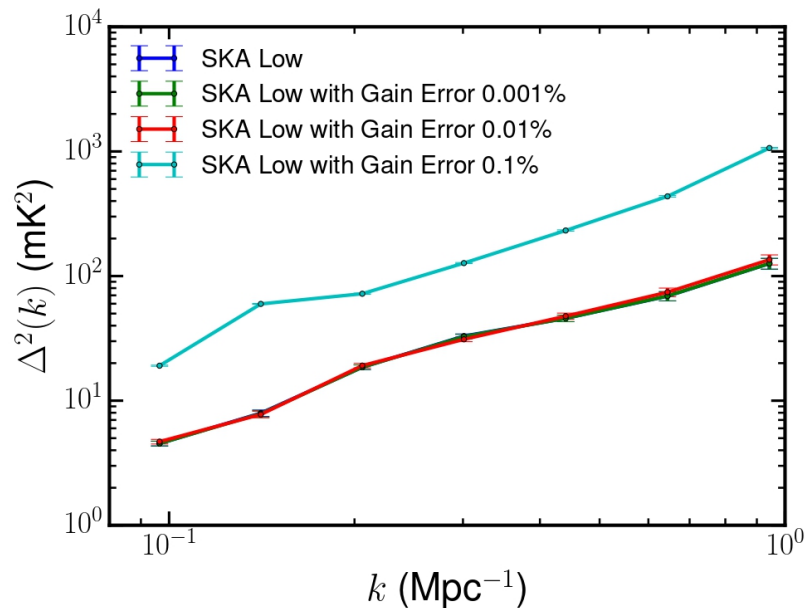
*Tripathi A et al. ( in prep)*

- In all cases, the ANN-based MCMC model's inferred ionizing efficiency ( $\zeta$ ) and  $T_{vir}$  closely match true values, but  $R_{mfp}$  is highly degenerate.
- Indicates model robustness for further study of calibrated Gain error and position error.

# SKA1-Low with Calibrated Gain Error

$$V_{ij}^m = g_i(t)g_j^*(t)V_{ij}^t$$

Gain error  $\left\{ \begin{array}{l} g_i = (a_i + \delta a_i)\exp(-i(\phi_i + \delta\phi_i)) \\ g_i = (1 + \delta a_i)\exp(-\delta\phi_i) \end{array} \right.$



# Summary/Takeaways

- Inherent bias in the 21cm power spectra due to the effect of the PSF of an radio interferometer.
- If the gain error exceeds 0.001% for both interferometers, our derived astrophysical parameters will be biased due to the presence of gain error.
- Position errors exceeding 0.05 arcsec will bias the astrophysical parameters.
- This pipeline can be extended to study effects of chromatic primary beam, radio frequency interferences, foregrounds with spectral features.