

# It's always darkest before the Cosmic Dawn

*First generation 21 cm results and lessons for next-generation arrays*

Josh Dillon  
UC Berkeley

# And, of course...

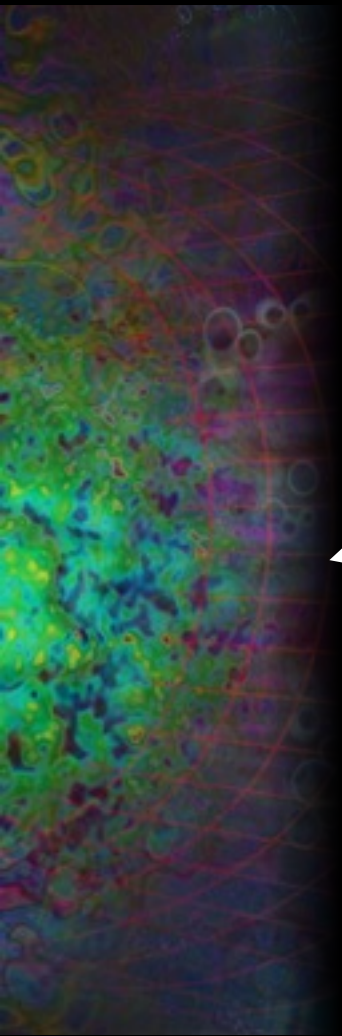
- Aaron Parsons
- Max Tegmark
- Jacqueline Hewitt
- Adrian Liu
- Aaron Ewall-Wice
- Jeff Zheng
- Jonathan Pober
- Andrei Mesinger
- Abraham Neben
- Miguel Morales

...and the MWA, PAPER, MITEoR, and HERA teams.



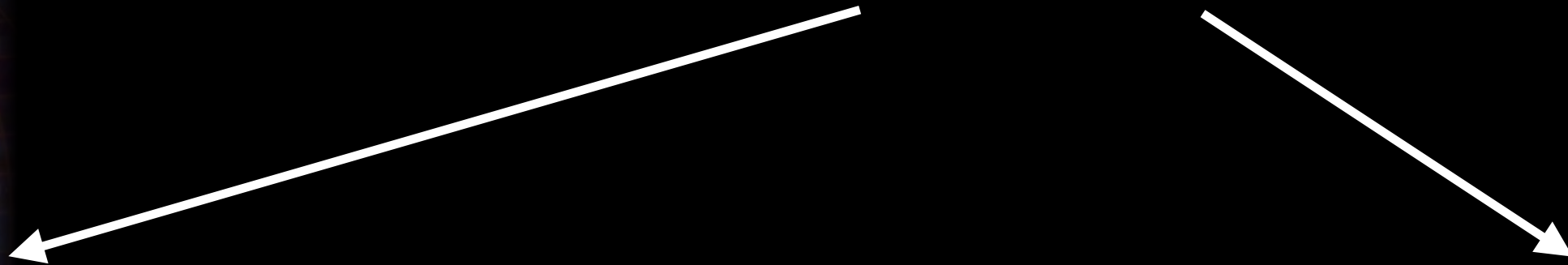
What is the “Cosmic Dawn”?

CMB

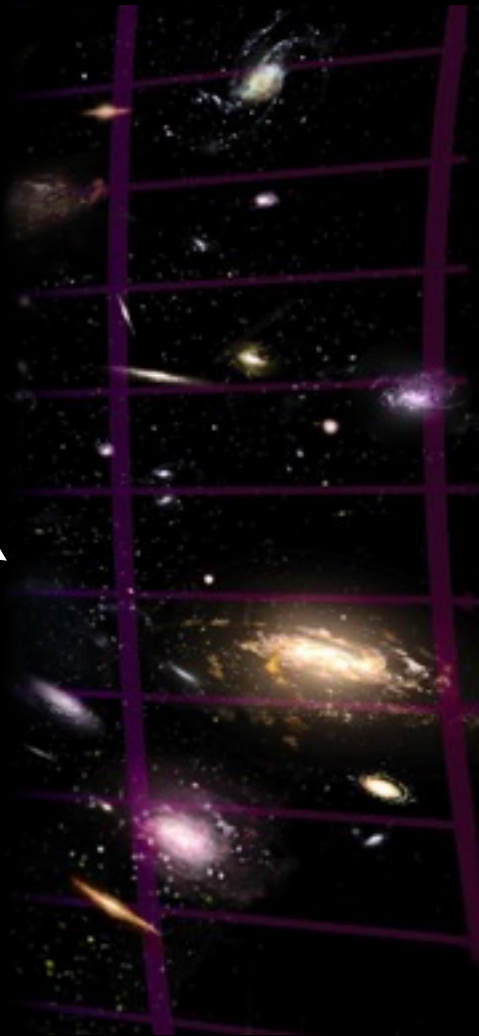


$z = 1100$

Observationally, we have  
few constraints on how we  
got from here to here.



Modern  
Galaxies



$z < 6$

Here's what we think...

Dark Ages

First Black Holes

# The Cosmic Dawn

First Stars

The Epoch of  
Reionization

$z = 1100$

$z < 6$

*Image: Avi Loeb & Scientific American*



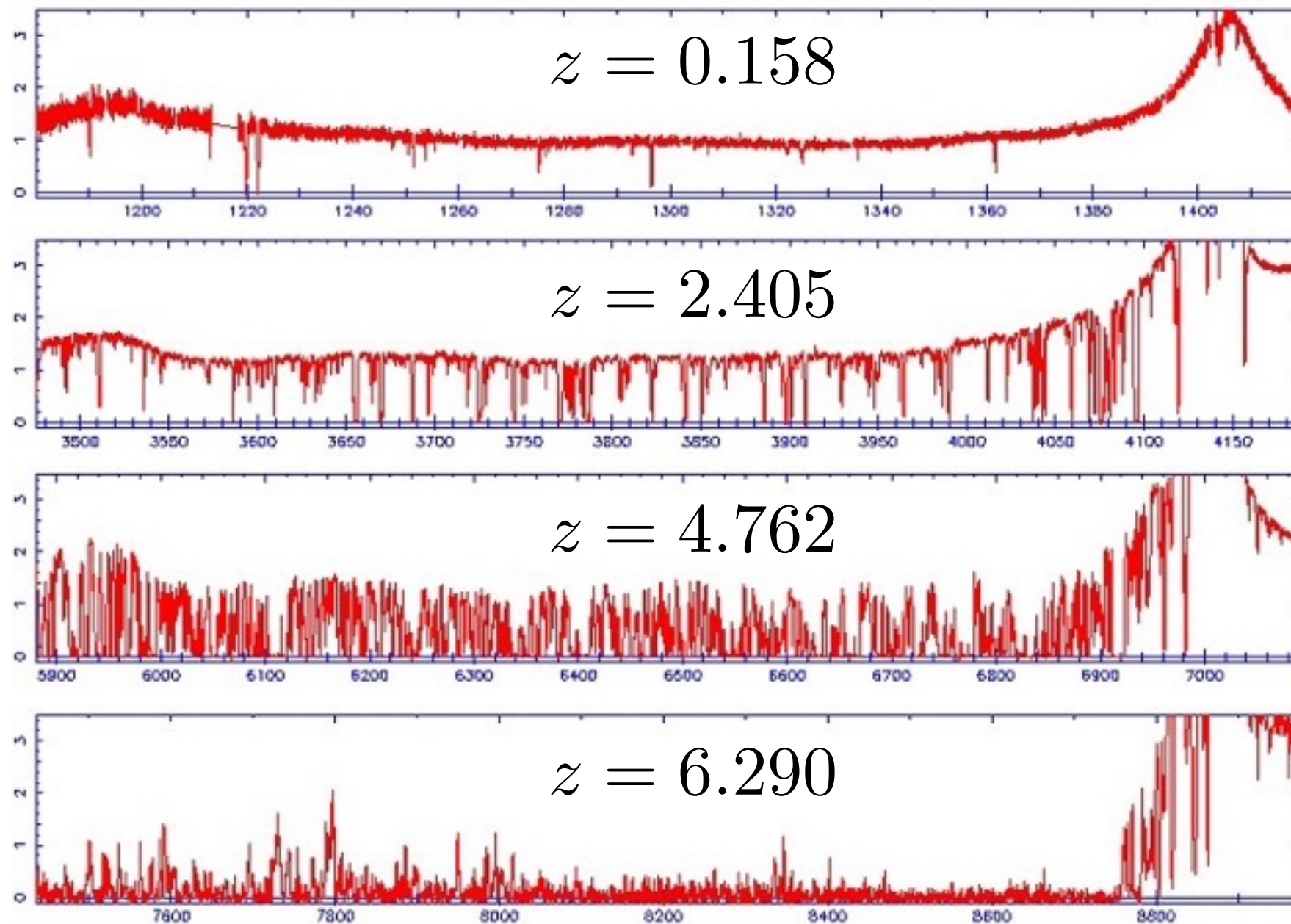
# And there's still a lot of open questions.

- What did the first stars, galaxies, and black holes look like and how did they form?
- What was the thermal and ionization history of the IGM and what determined it?
- Can we measure the matter power spectrum during this epoch and test  $\Lambda$ CDM?

The Epoch of Reionization is our first target.

What do we know already?

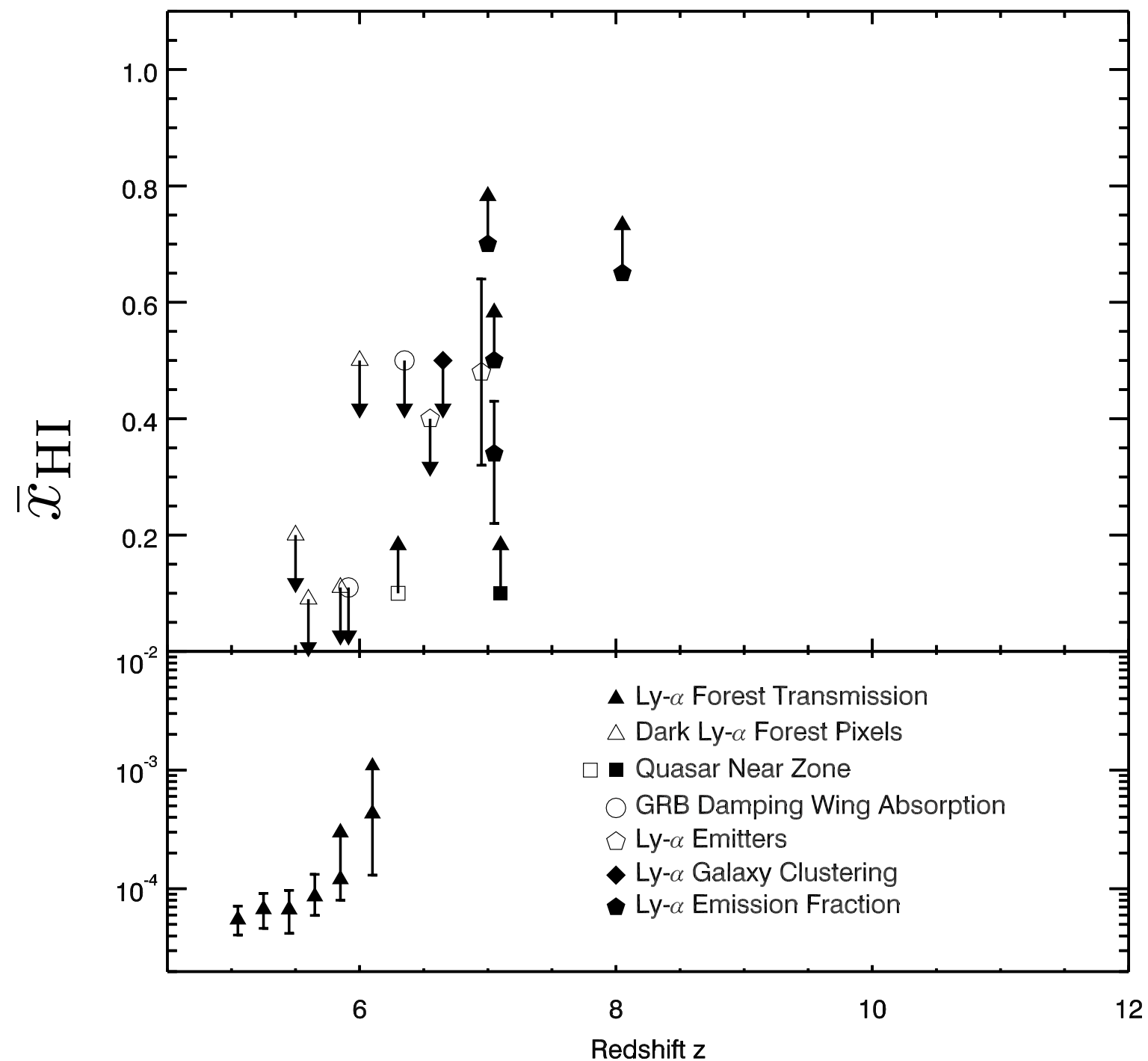
# Reionization ended around redshift 6.



Wavelength (Å)



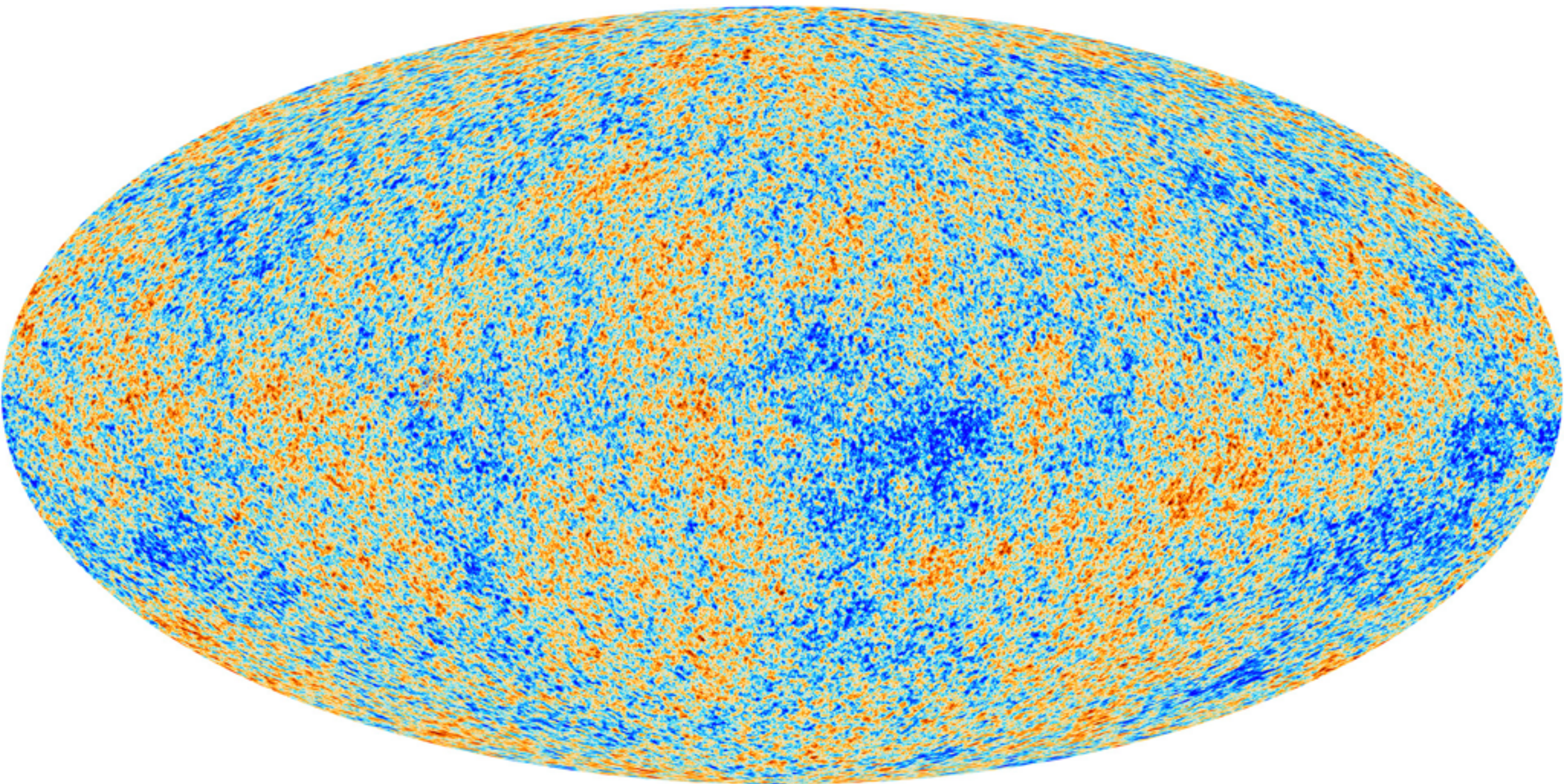
But it's hard to figure out exactly  
when it started or how it proceeded.



Compiled by Robertson et al. (2015)



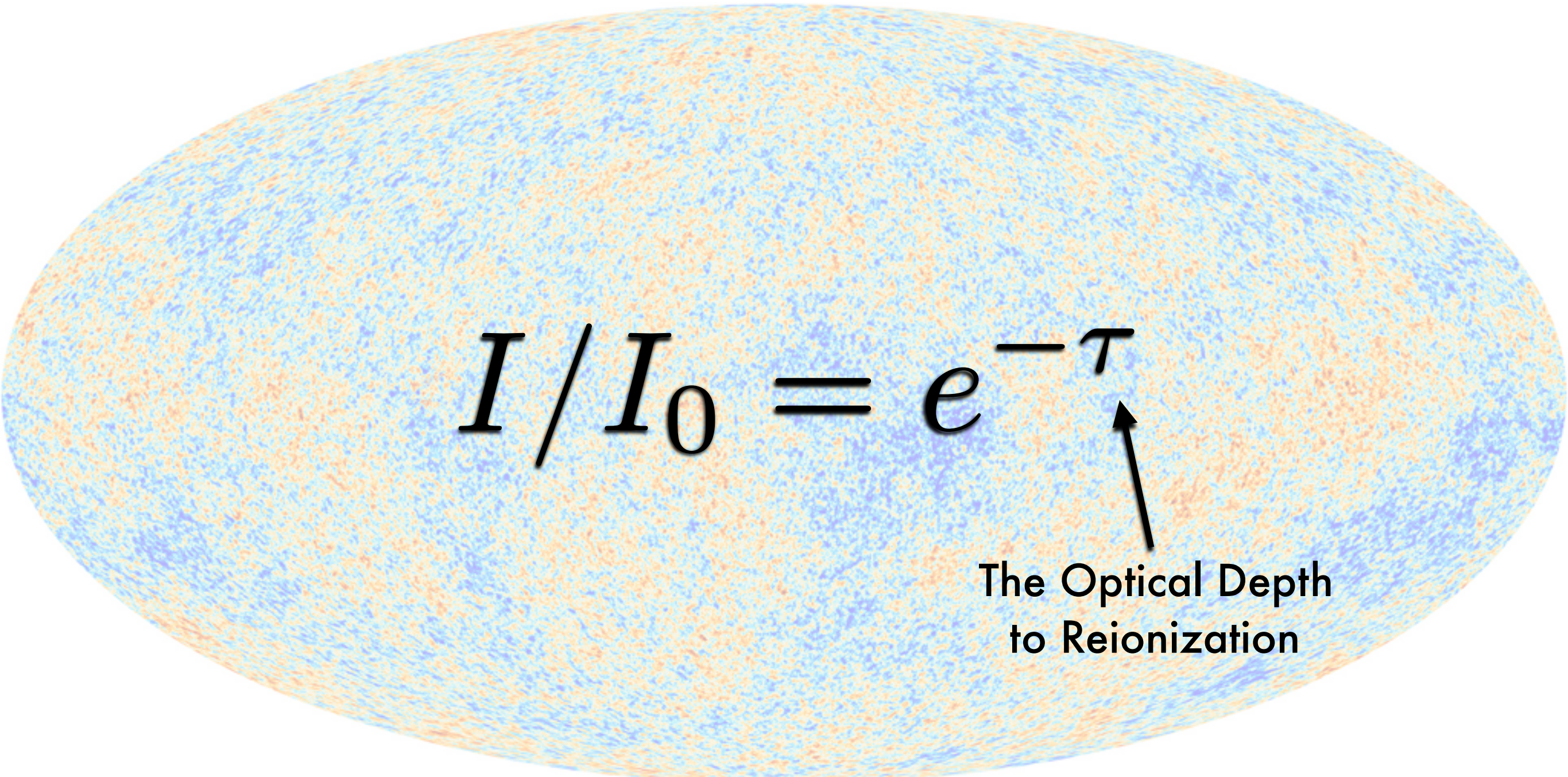
**We also get an integral constraint  
on reionization from the CMB.**



*Image: Planck Collaboration*



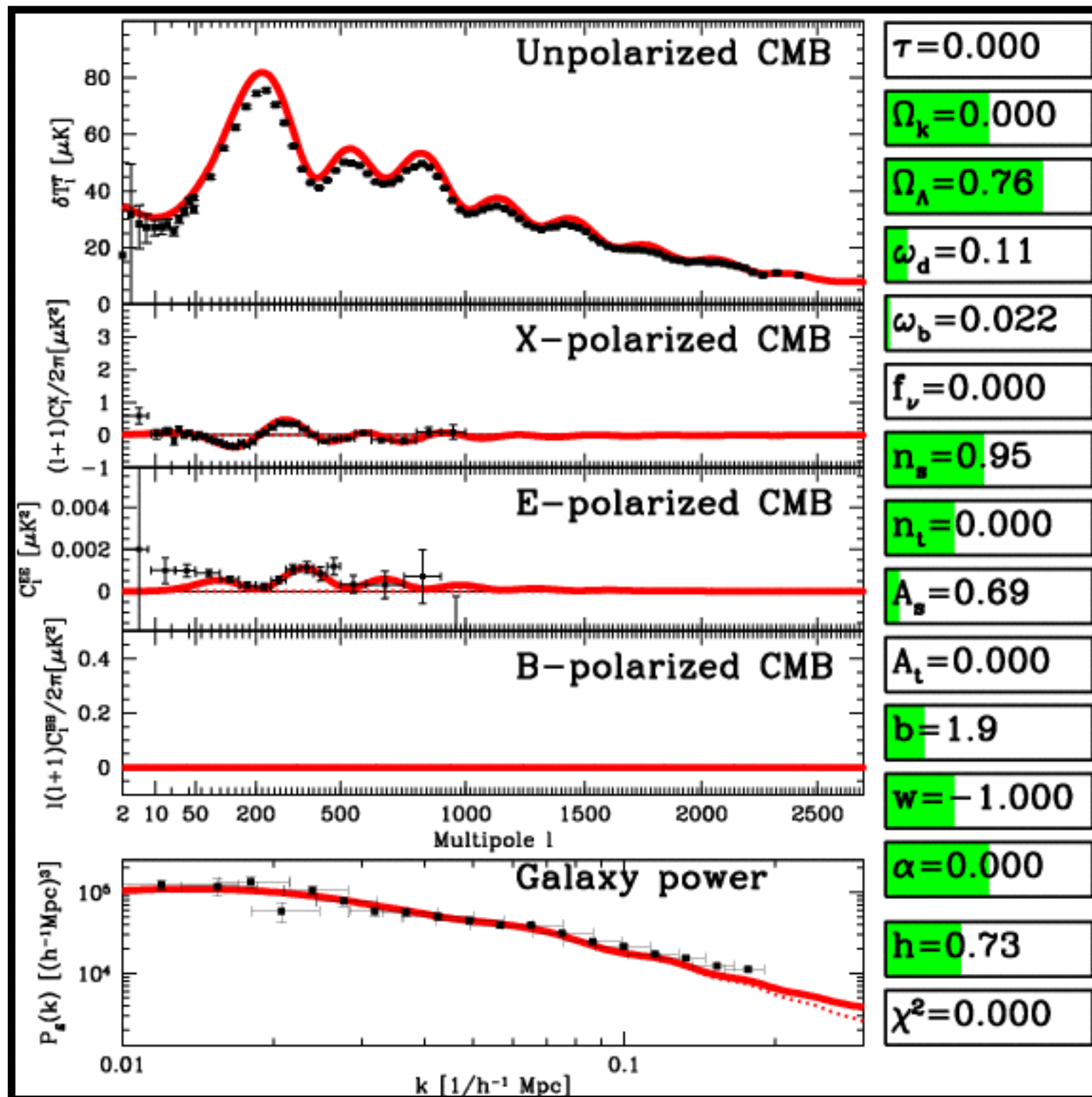
**We also get an integral constraint  
on reionization from the CMB.**


$$I/I_0 = e^{-\tau}$$

The Optical Depth  
to Reionization

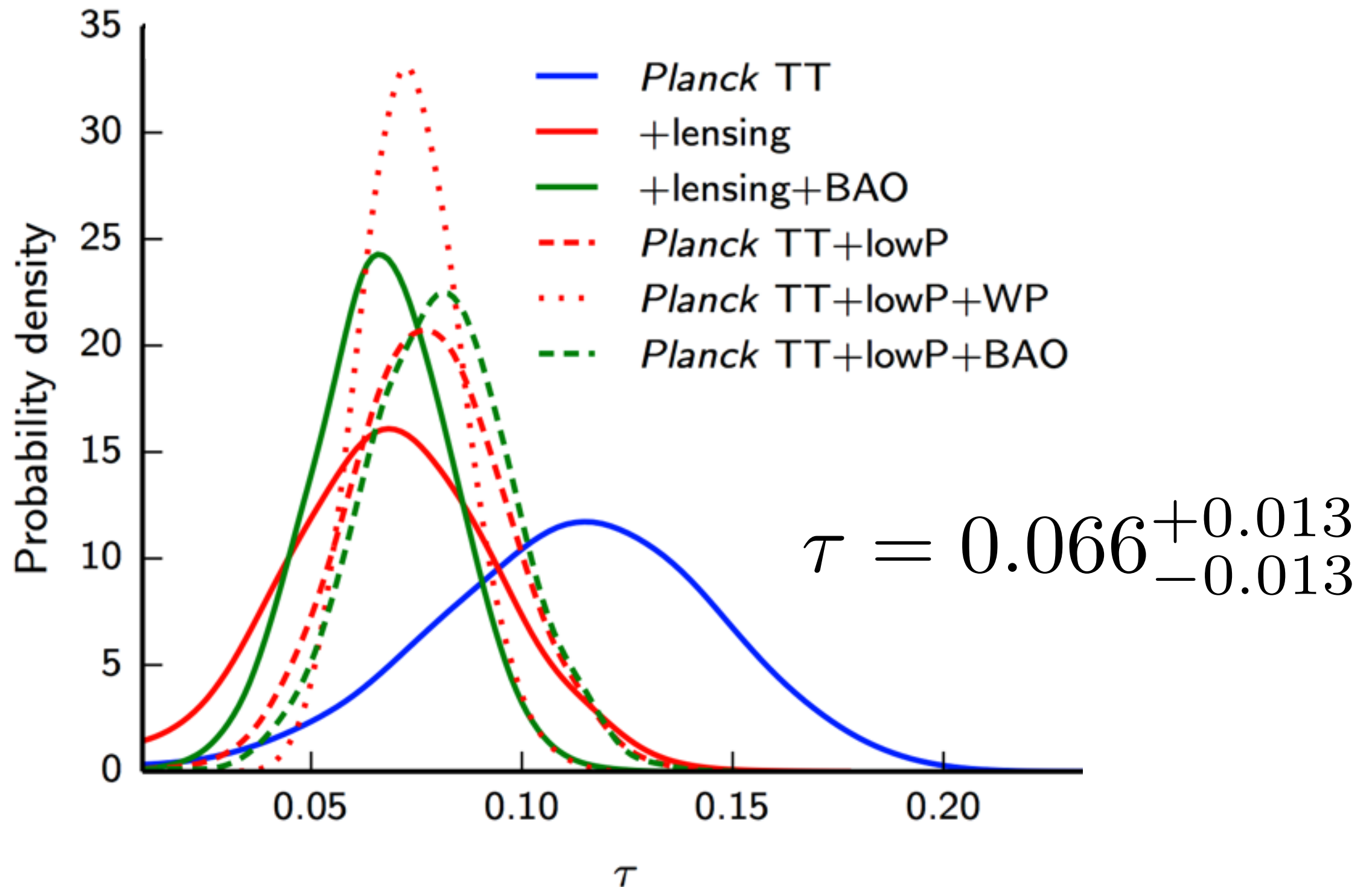


# Constraining Tau



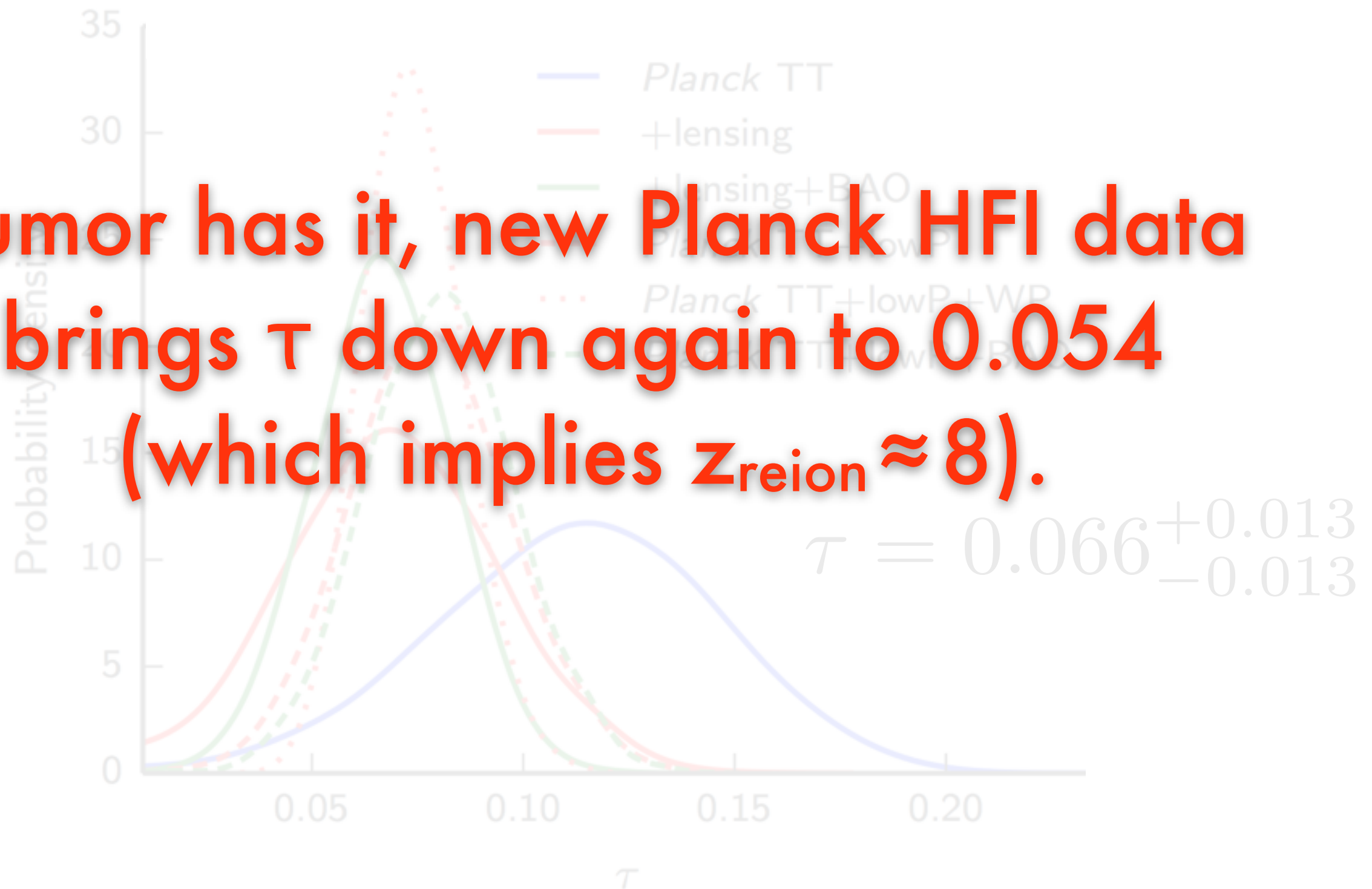
Using the low- $\ell$  modes of the EE power spectrum, the optical depth can be constrained from the CMB alone.

In Planck 2015,  $\tau$  came down by about 20% due to improved removal of diffuse polarized foregrounds.

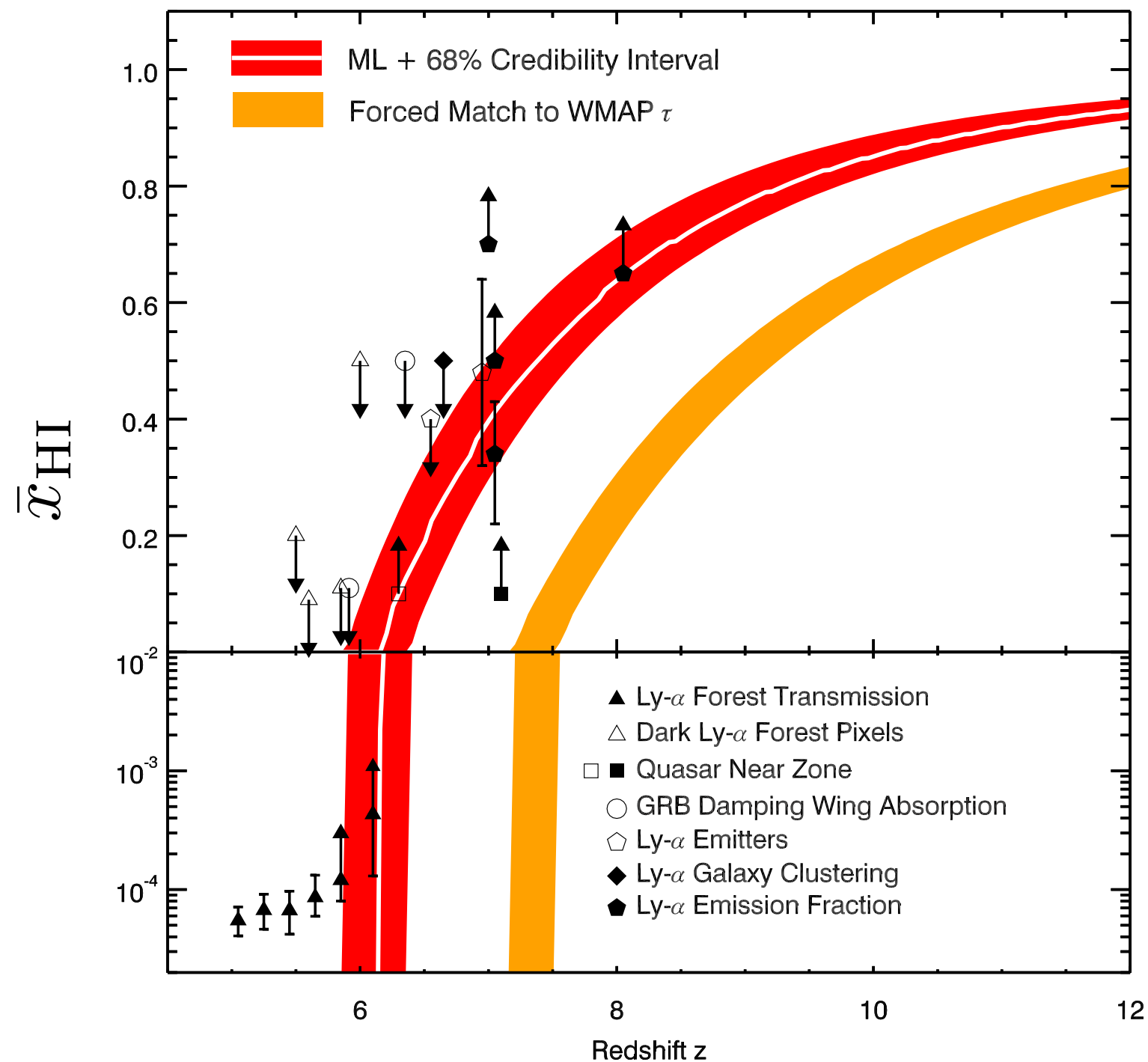


In Planck 2015,  $\tau$  came down by about 20% due to improved removal of diffuse polarized foregrounds.

**Rumor has it, new Planck HFI data brings  $\tau$  down again to 0.054 (which implies  $z_{\text{reion}} \approx 8$ ).**



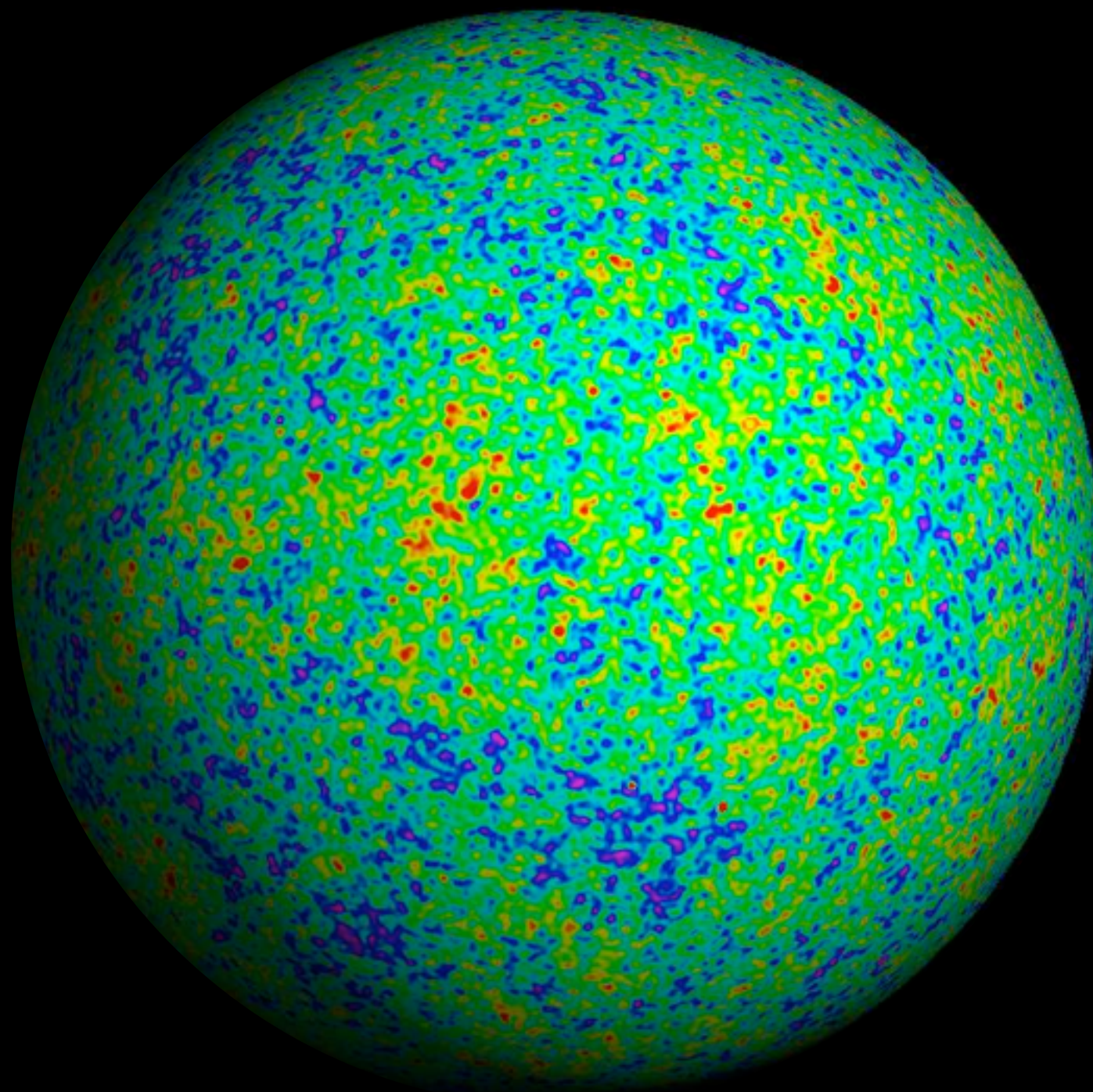
With some assumptions about reionization physics, it's possible to get a reionization history that's consistent with extrapolated SFR histories.



How can we observe the  
Cosmic Dawn directly?

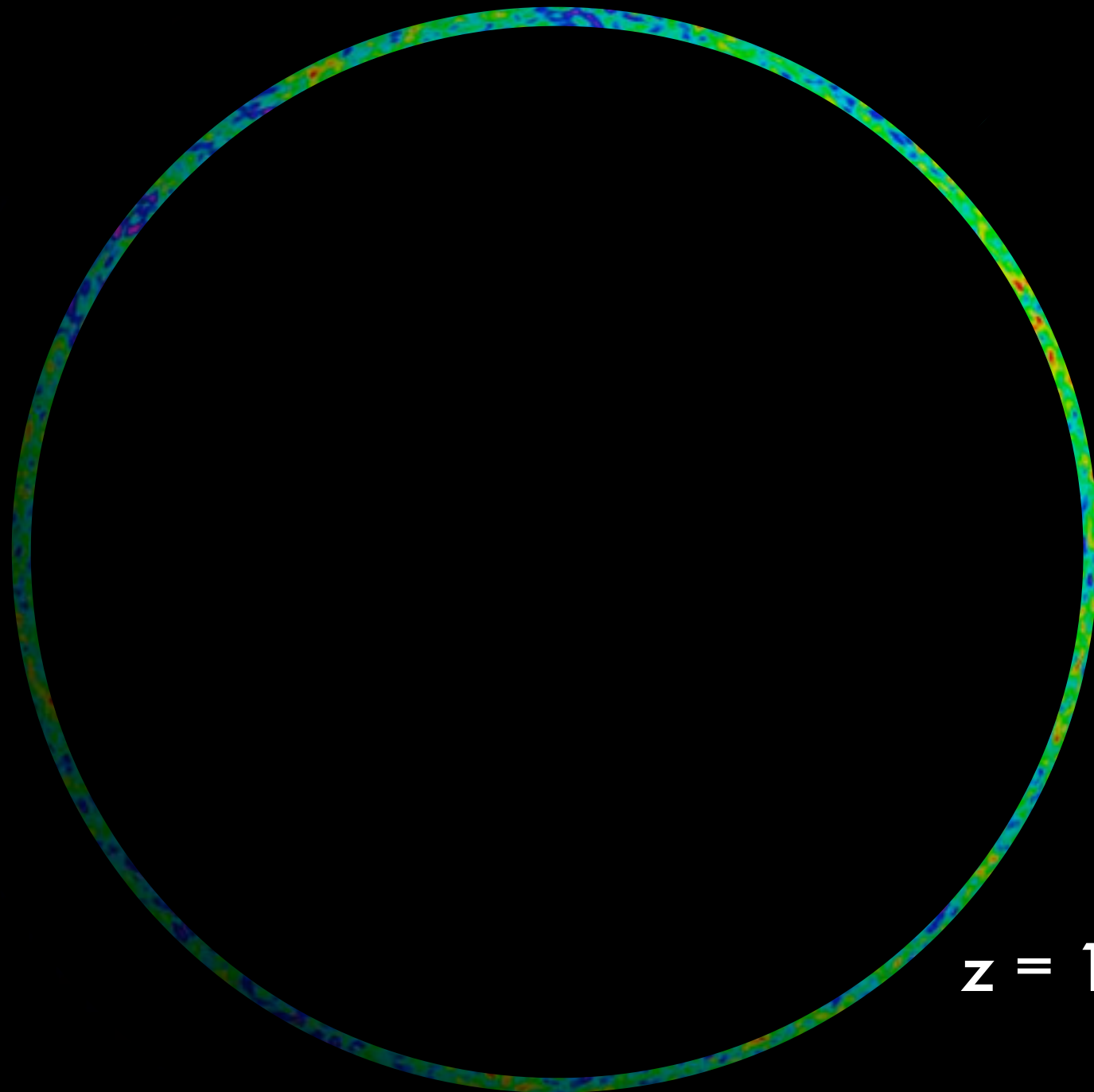


With the CMB...



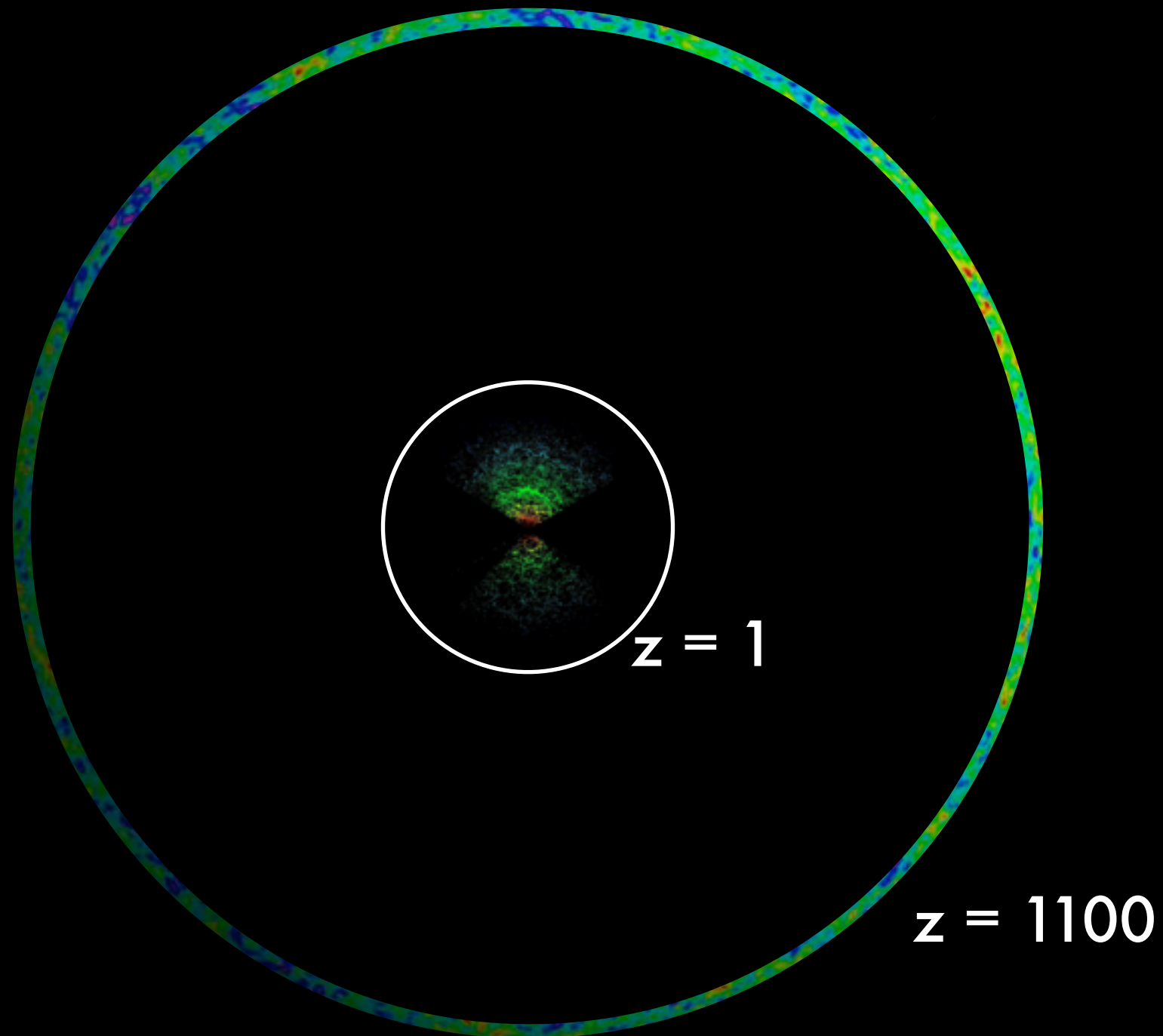


...we only get a thin shell at high redshift.

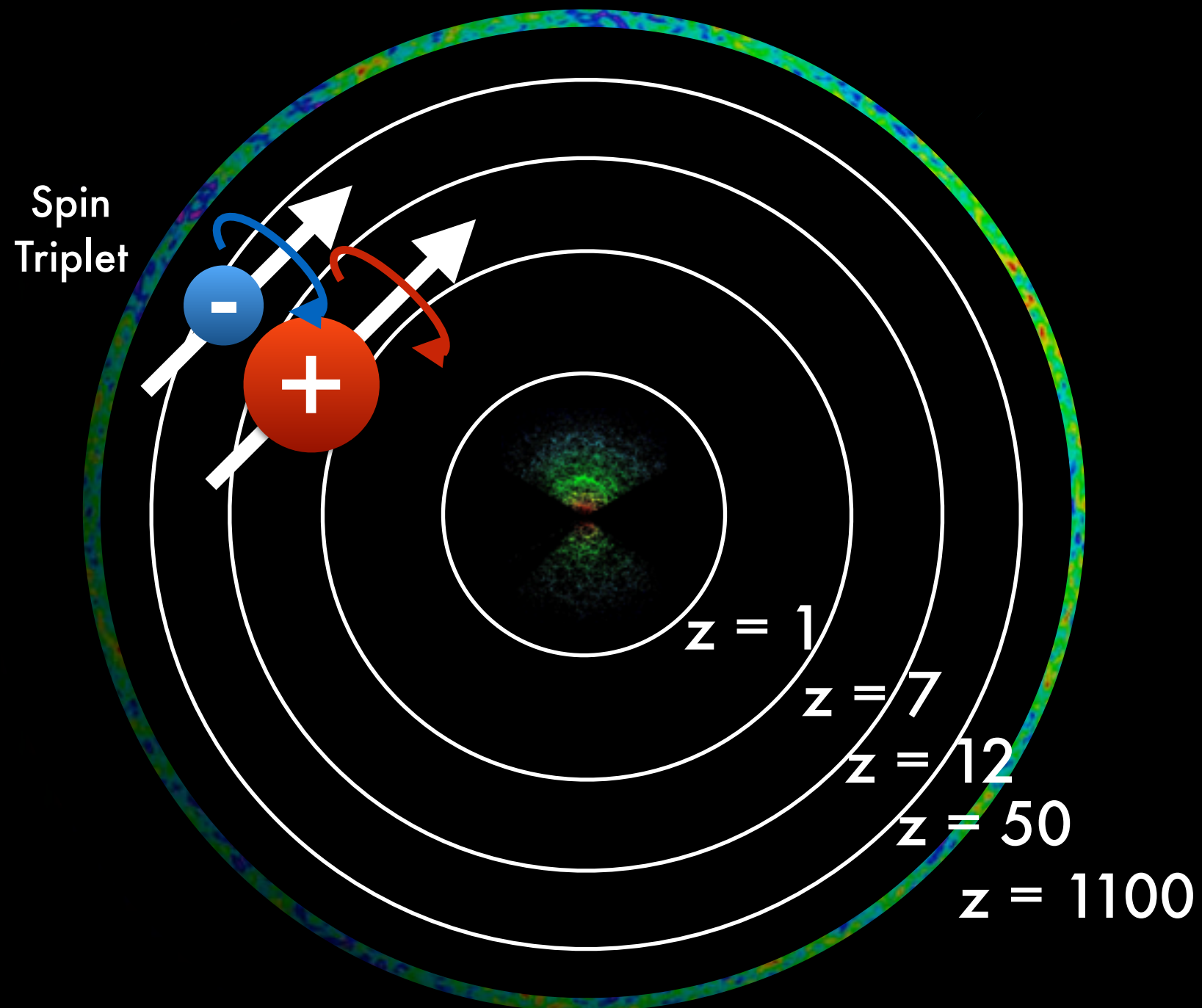


$z = 1100$

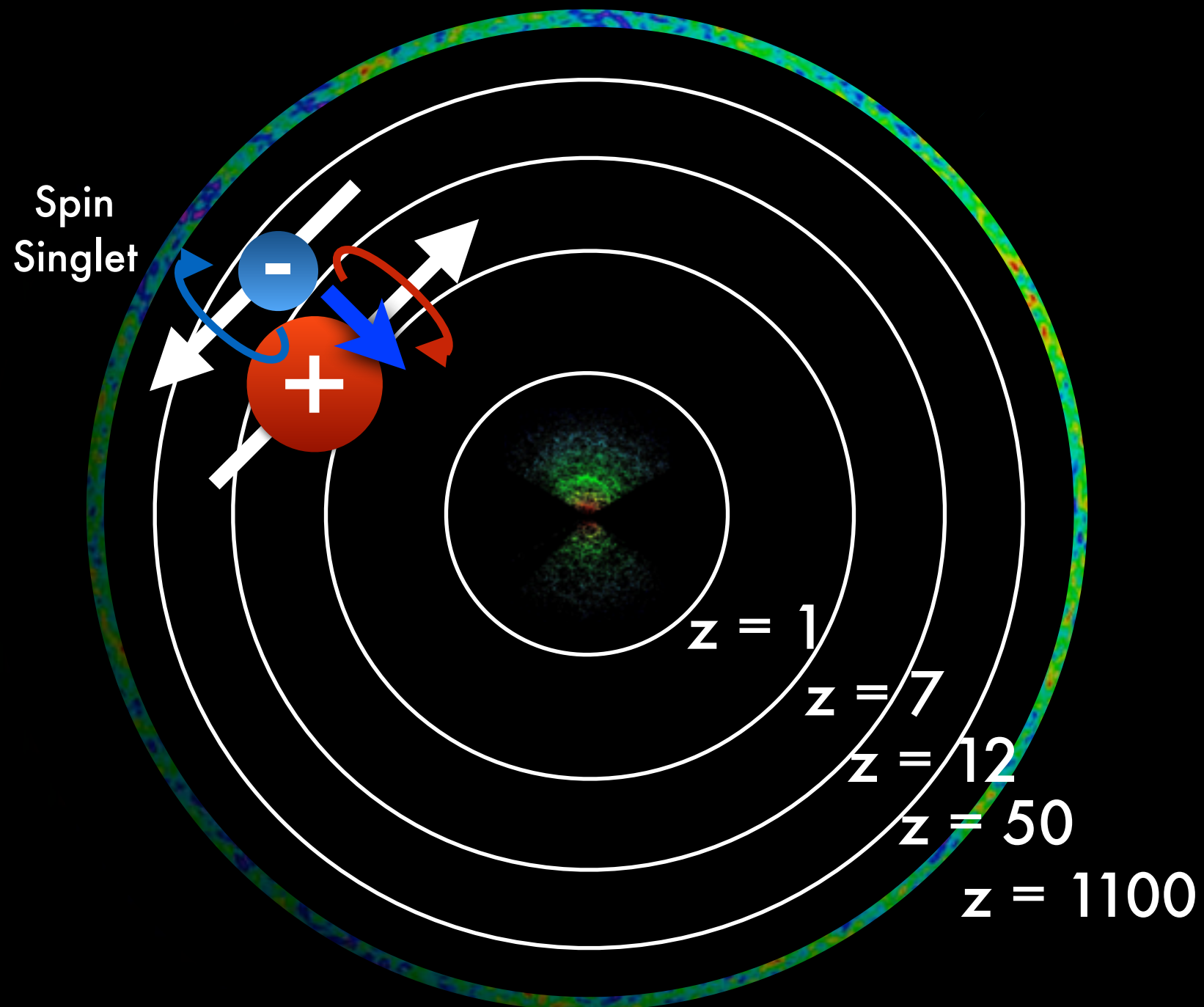
Galaxy surveys only tell us about the local universe.



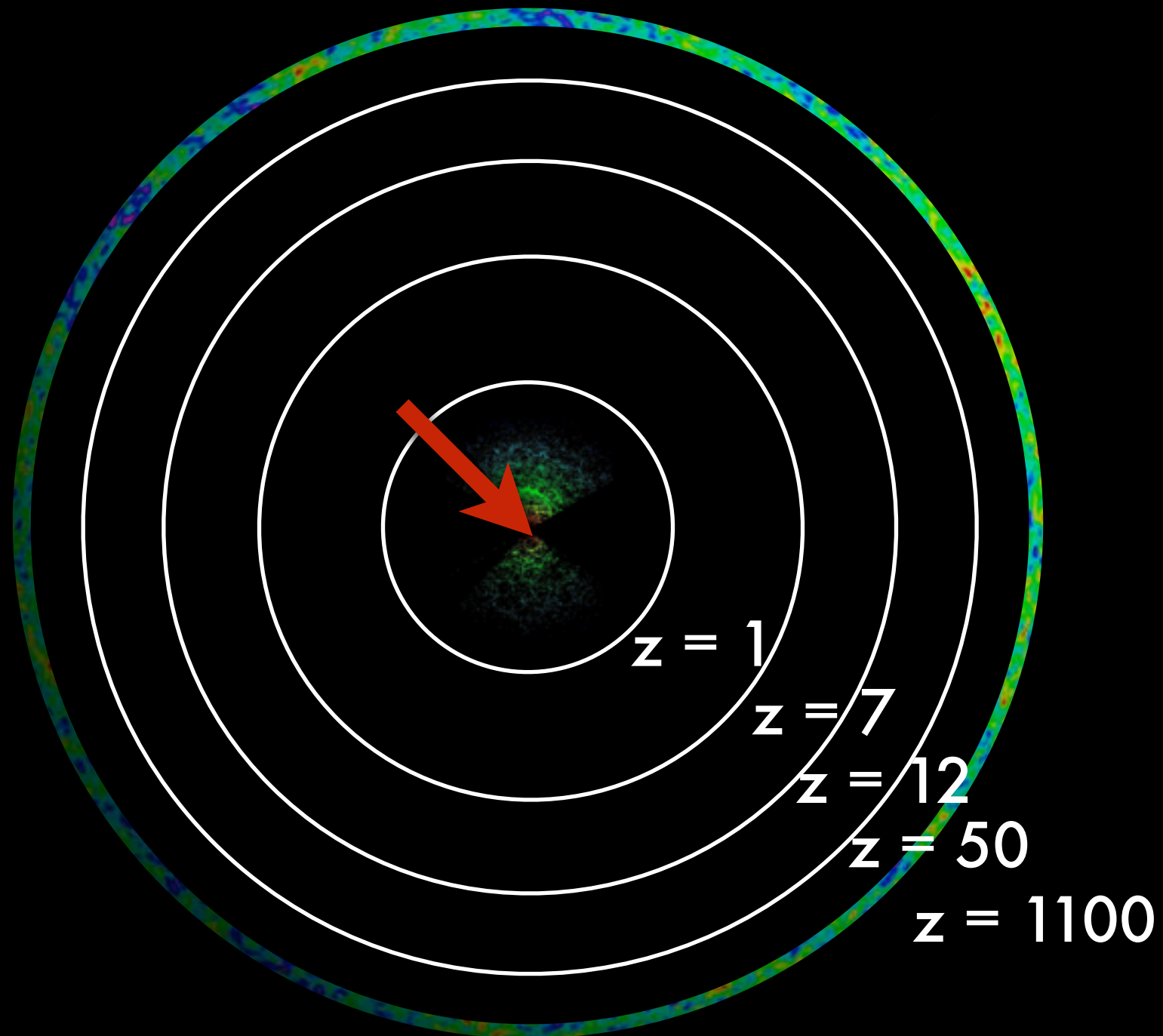
# So we turn to 21 cm Tomography.



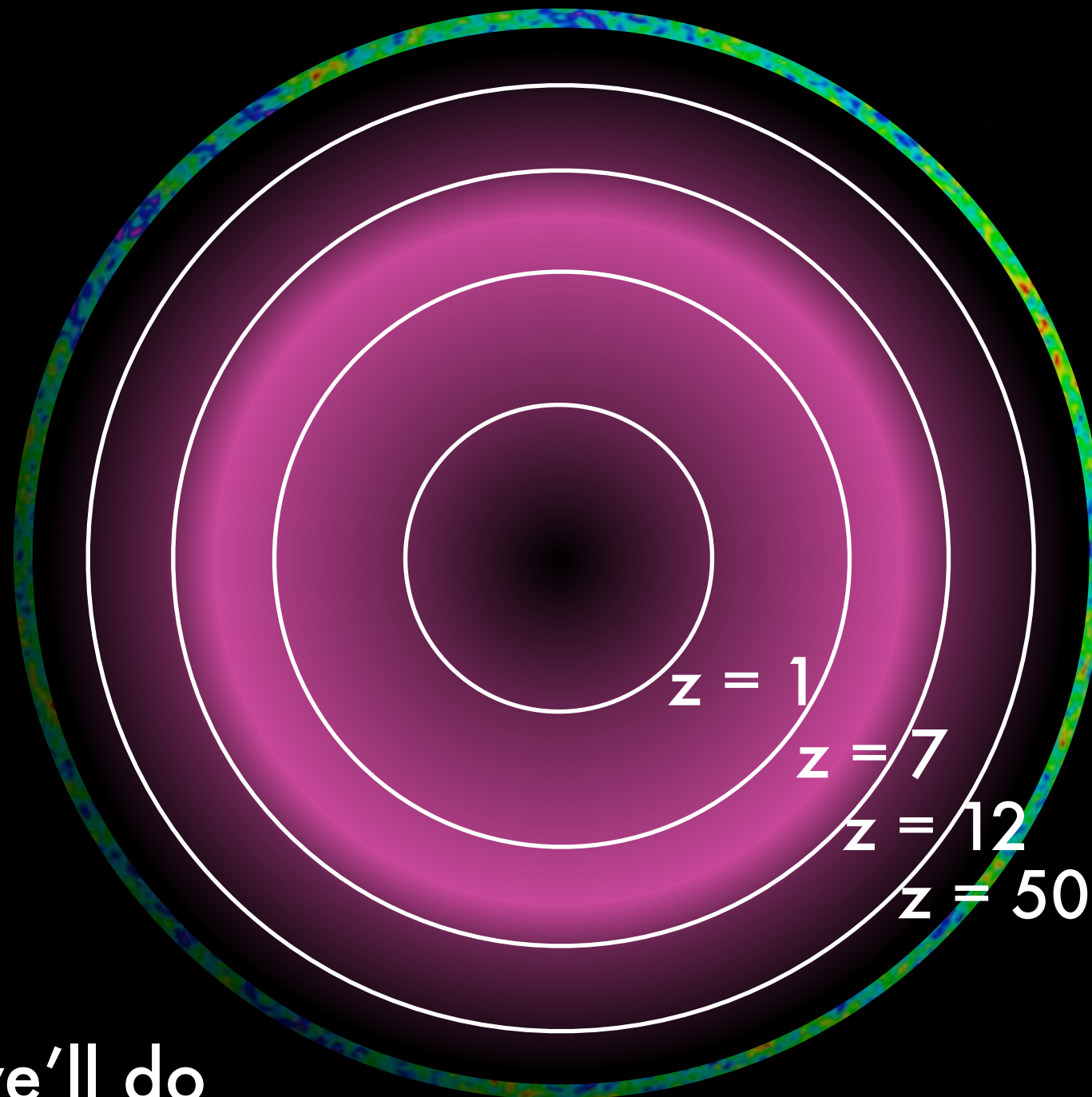
# So we turn to 21 cm Tomography.



So we turn to 21 cm Tomography.

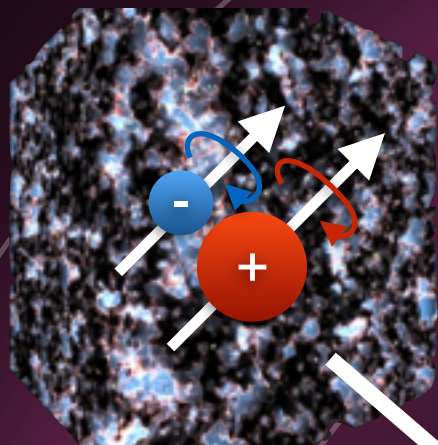


A huge volume of the universe can be explored with 21 cm tomography.

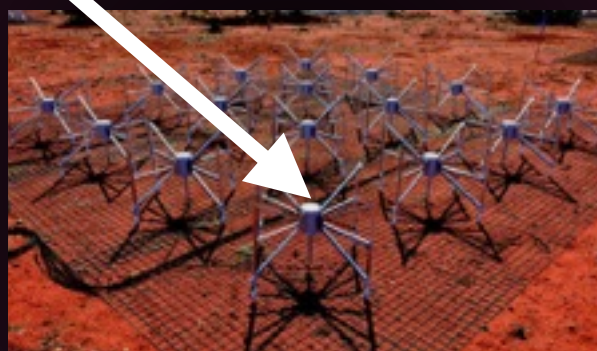


Eventually, we'll do cosmology very precisely.

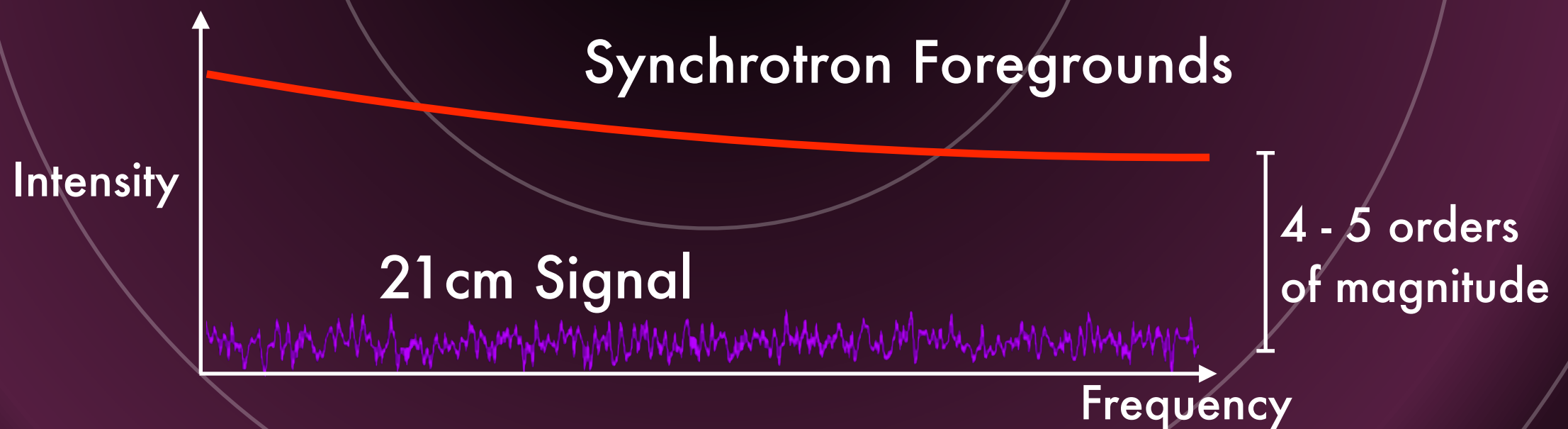
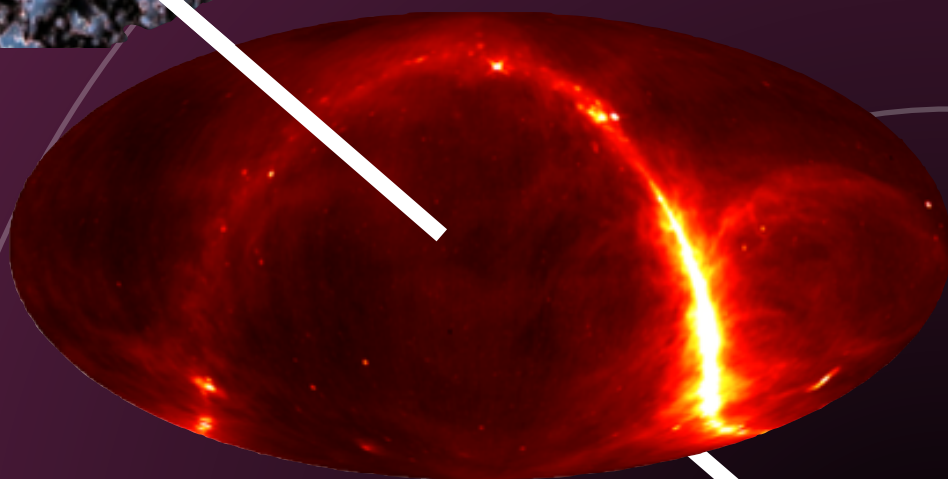
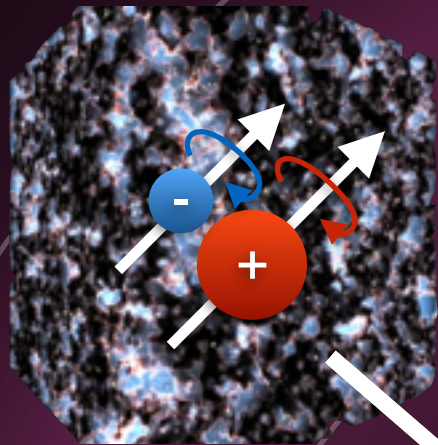




$$\delta T_{21 \text{ cm}} \propto x_{\text{HI}}(1 + \delta) \left[ 1 - \frac{T_{\text{CMB}}}{T_s} \right]$$

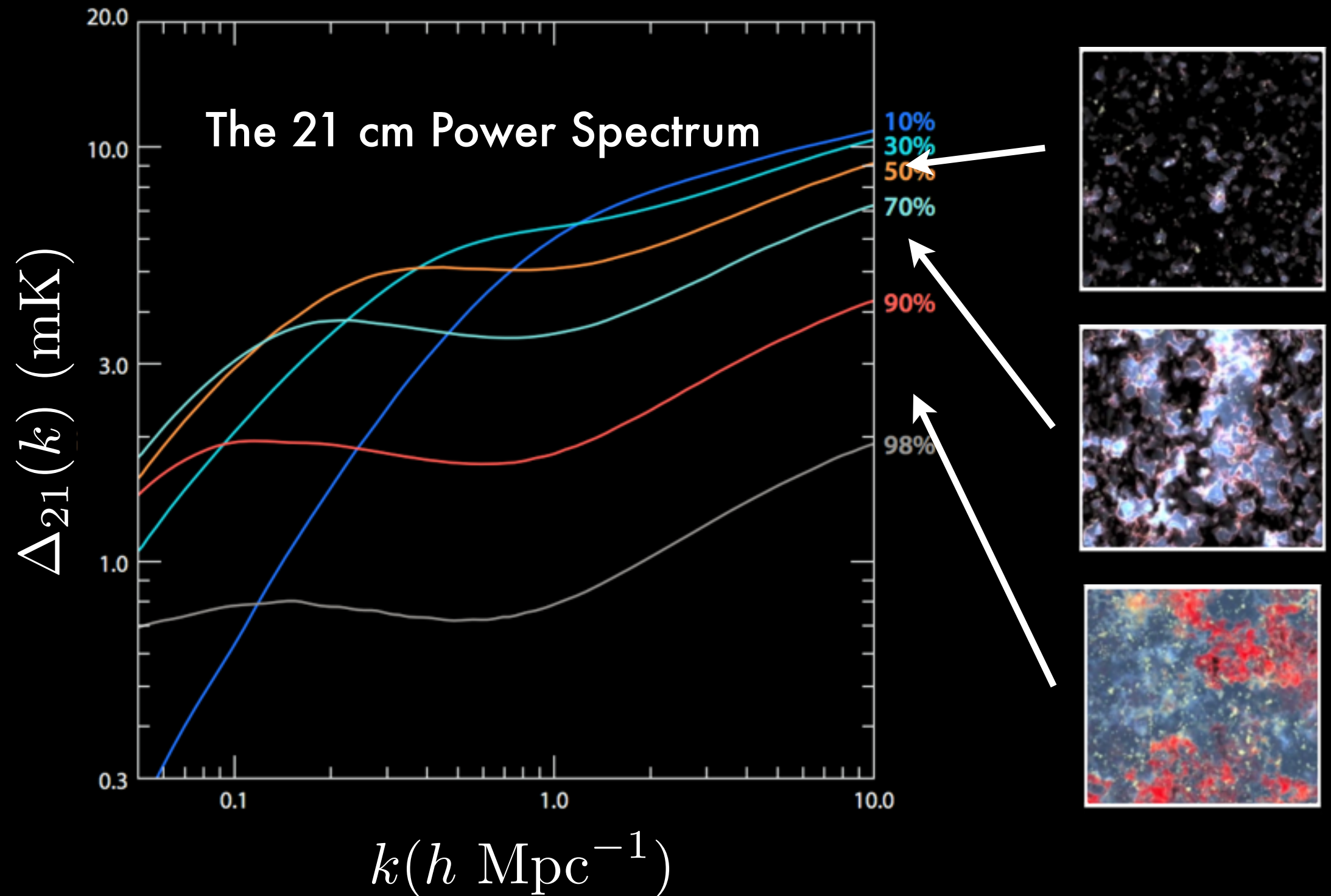


The problem is the foregrounds  
(our galaxy and other galaxies)  
that are in the way.

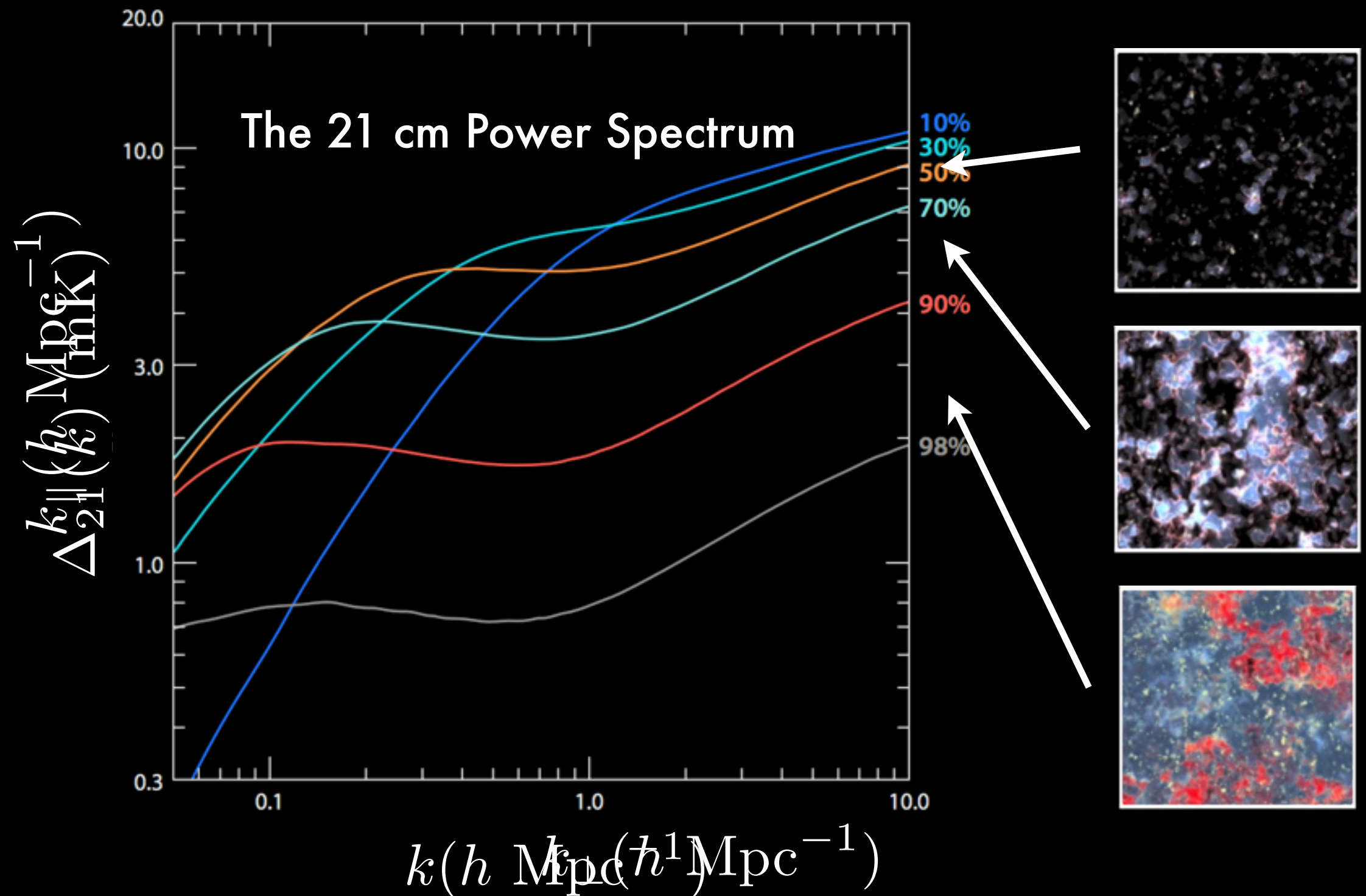




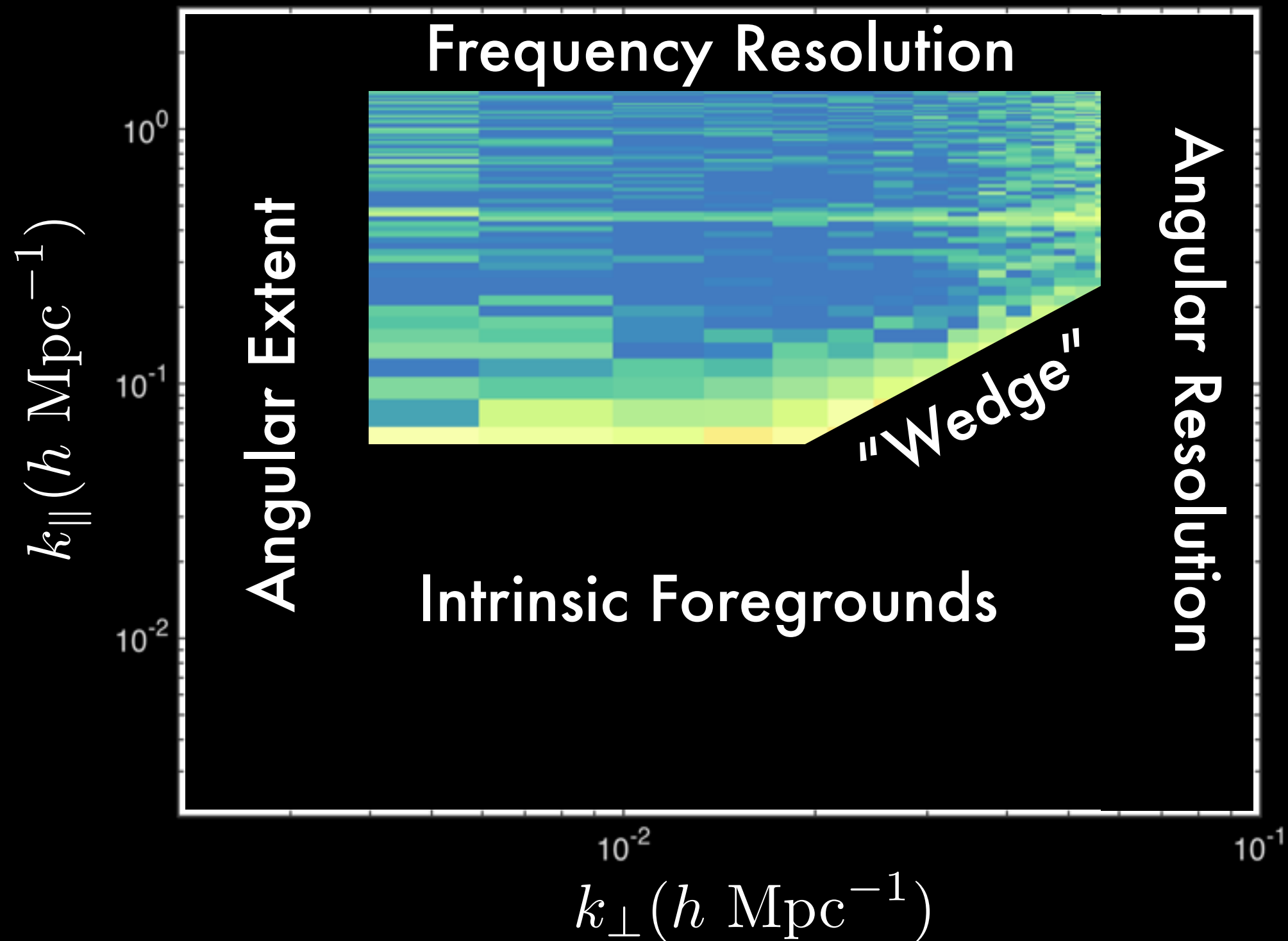
# The first detection will be statistical.



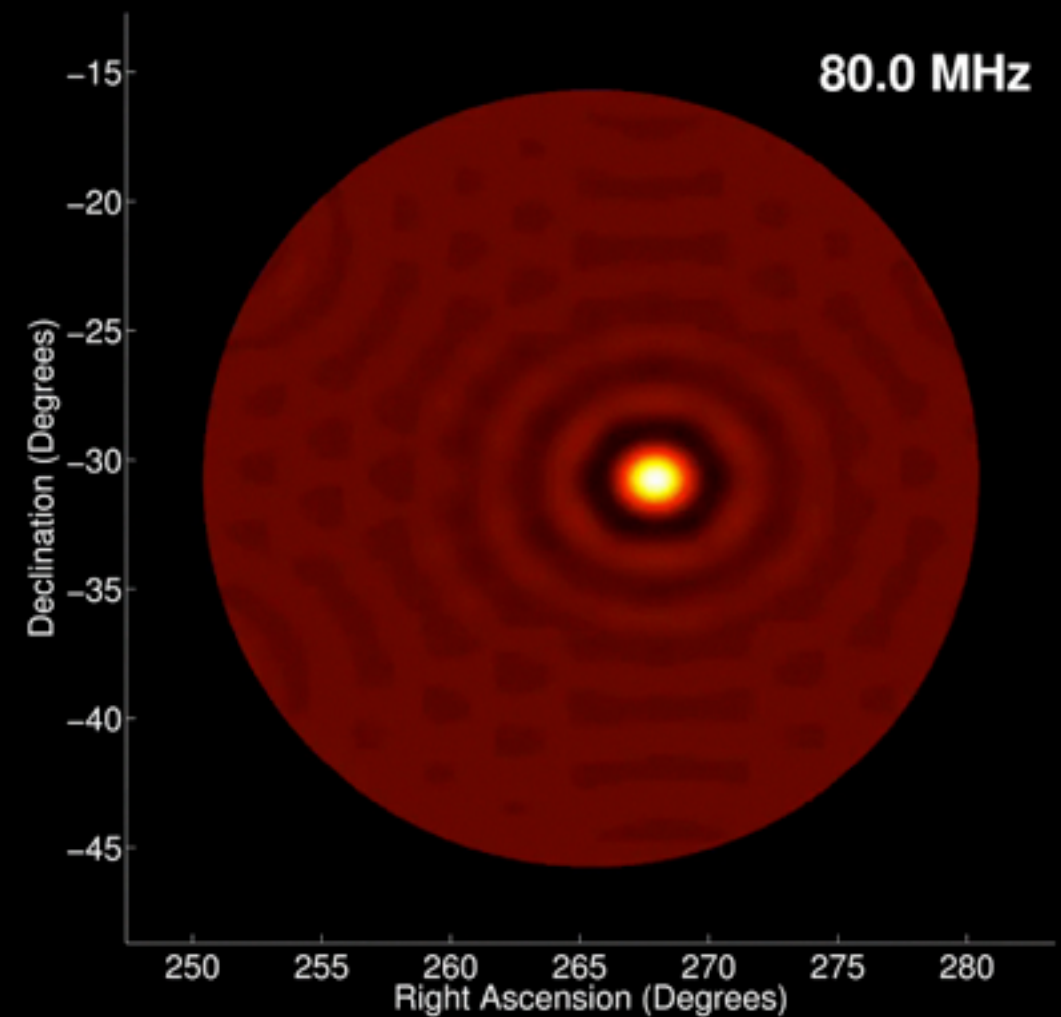
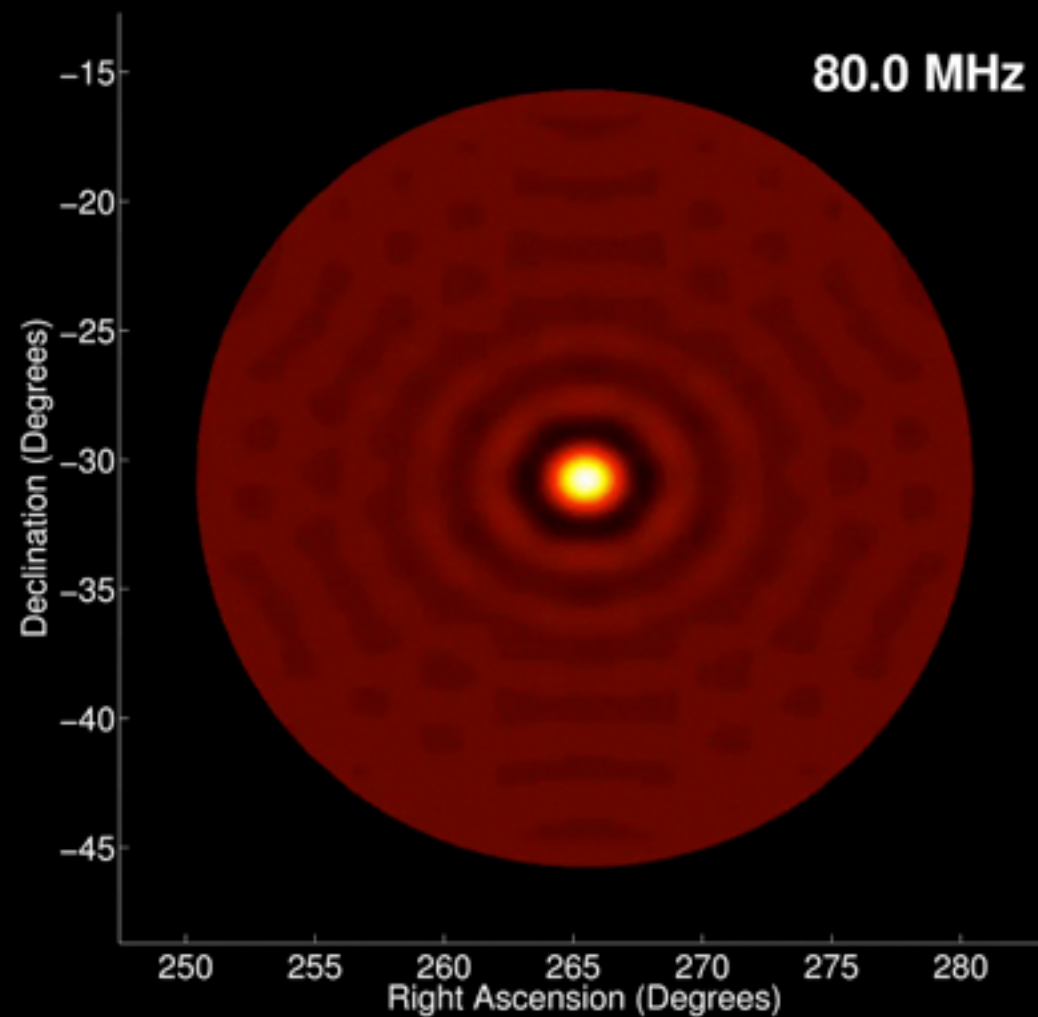
We separate out Fourier modes parallel and  
 But instead of spherically averaged Fourier space...  
 perpendicular to the line of sight.



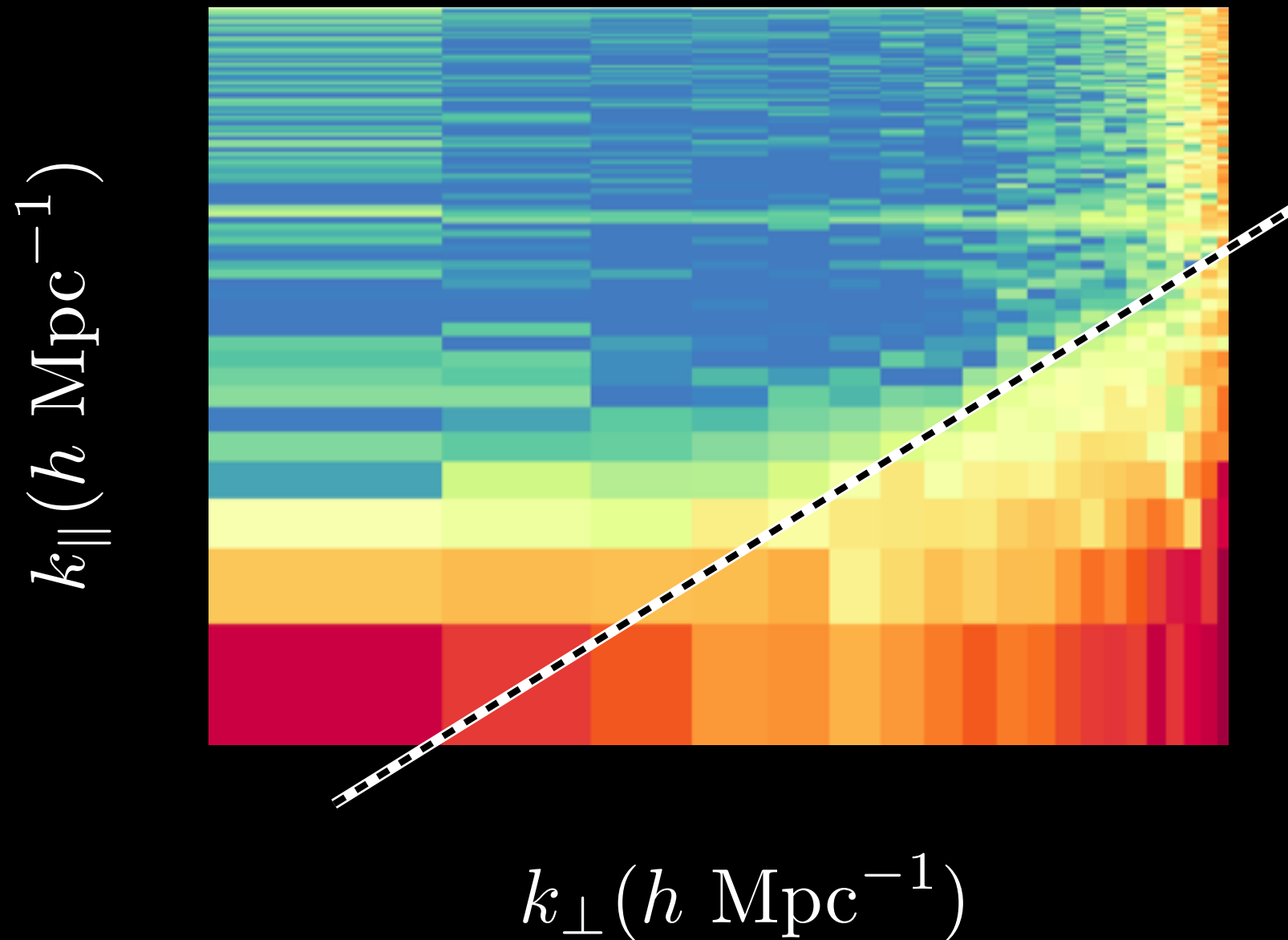
# And we find an “EoR Window.”



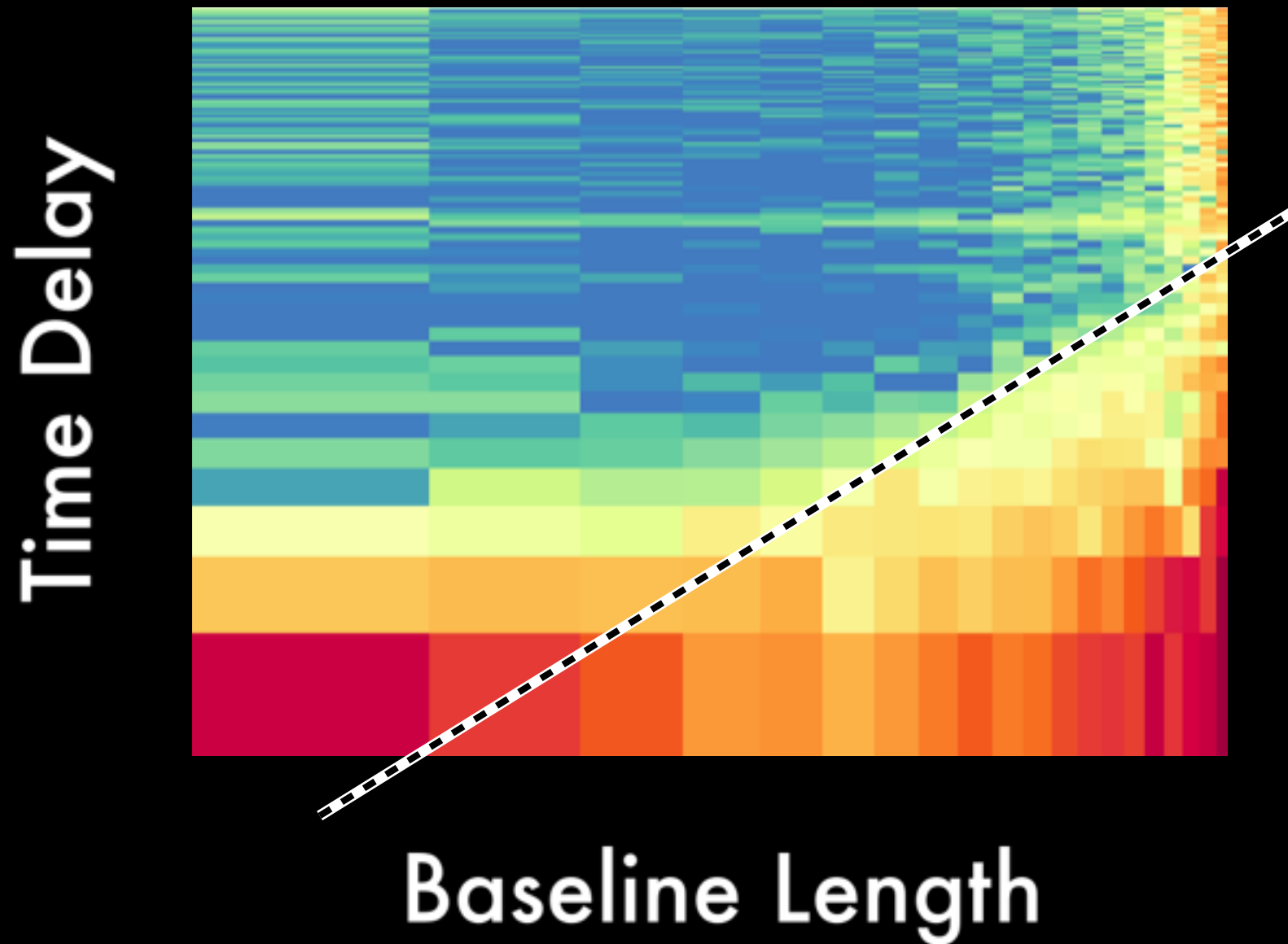
The “wedge” arises from the frequency-dependent point spread function creating spectral structure in spectrally smooth foregrounds.



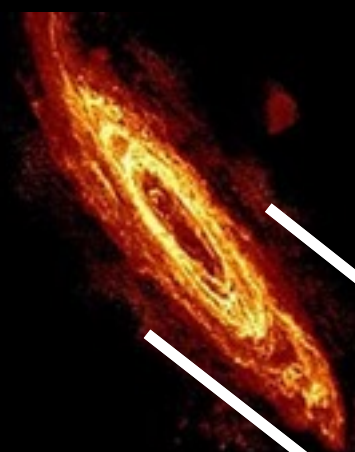
# The wedge is limited by geometry.



# The wedge is limited by geometry.







Time Delay

Horizon  
Delay

Baseline Length

$\Delta t$

The maximum delay of a foreground object is set by the horizon and the length of the baseline.

*Parsons et al. (2012)*





Time Delay

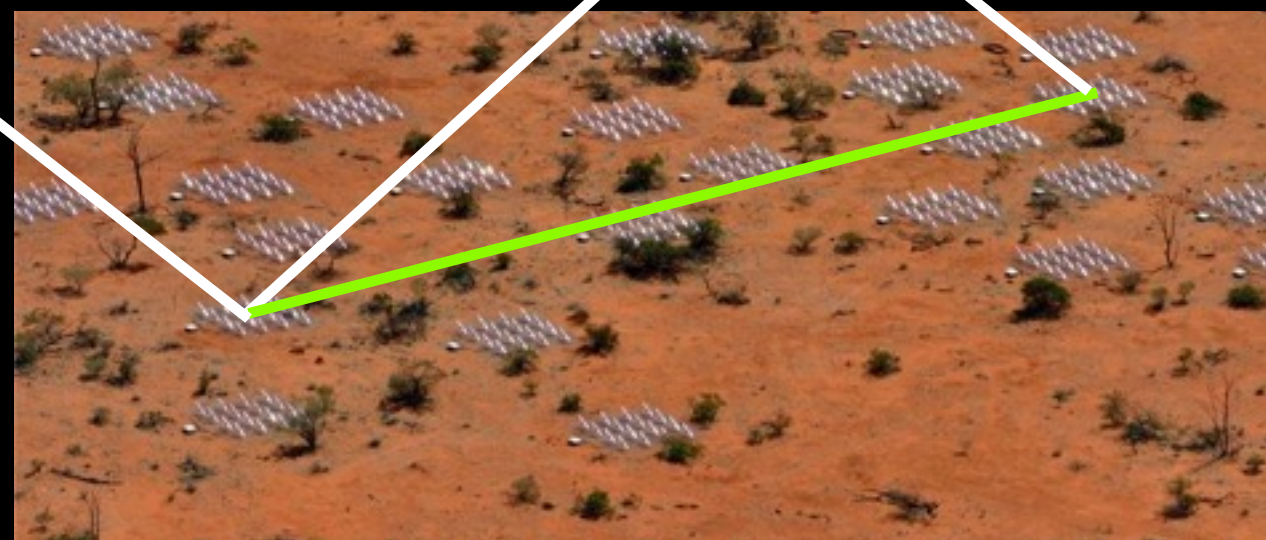
Horizon  
Delay

Baseline Length

$\Delta t$

The maximum delay of a foreground object is set by the horizon and the length of the baseline.

*Parsons et al. (2012)*





First generation interferometers are pursuing all sorts of different strategies for detecting the EoR.



And lots of related experiments in 21 cm Cosmology:  
ASKAP, BAOBAB, BINGO, CHIME, CRT, DARE, EDGES, HIRAX  
EMBRACE, GBT, KAT-7, LEDA, LWA, MeerKAT, SKA...and more.



First generation interferometers are pursuing all sorts of different strategies for detecting the EoR.



And lots of related experiments in 21 cm Cosmology:  
ASKAP, BAOBAB, BINGO, CHIME, CRT, DARE, EDGES, HIRAX  
EMBRACE, GBT, KAT-7, LEDA, LWA, MeerKAT, SKA...and more.

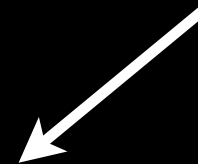
So, how do we keep the EoR window clean and understand our our measurements errors?

# In an ideal world, there's an optimal estimator...

Invertible  
Normalization  
Matrix



Inverse  
Covariance  
Weighting

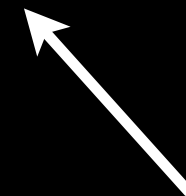


$\mathbf{X}$



Data

Fourier  
Transform  
and Bin



Quadratic Power Spectrum Estimator  
preserves all cosmological information  
(adapted from CMB and galaxy survey work)

...which we apply as best we can.

*MWA*: Noise and Foreground Weighting  
*PAPER*: Delay-Filter and Weighting

$$\hat{p}^\beta \equiv M^{\alpha\beta} \mathbf{x}^\top \mathbf{C}^{-1} \mathbf{Q}^\alpha \mathbf{C}^{-1} \mathbf{x}$$

*MWA*: Image Cubes  
*PAPER*: Visibilities

*MWA*: Fourier Transform and Bin  
*PAPER*: Combine Redundant Visibilities

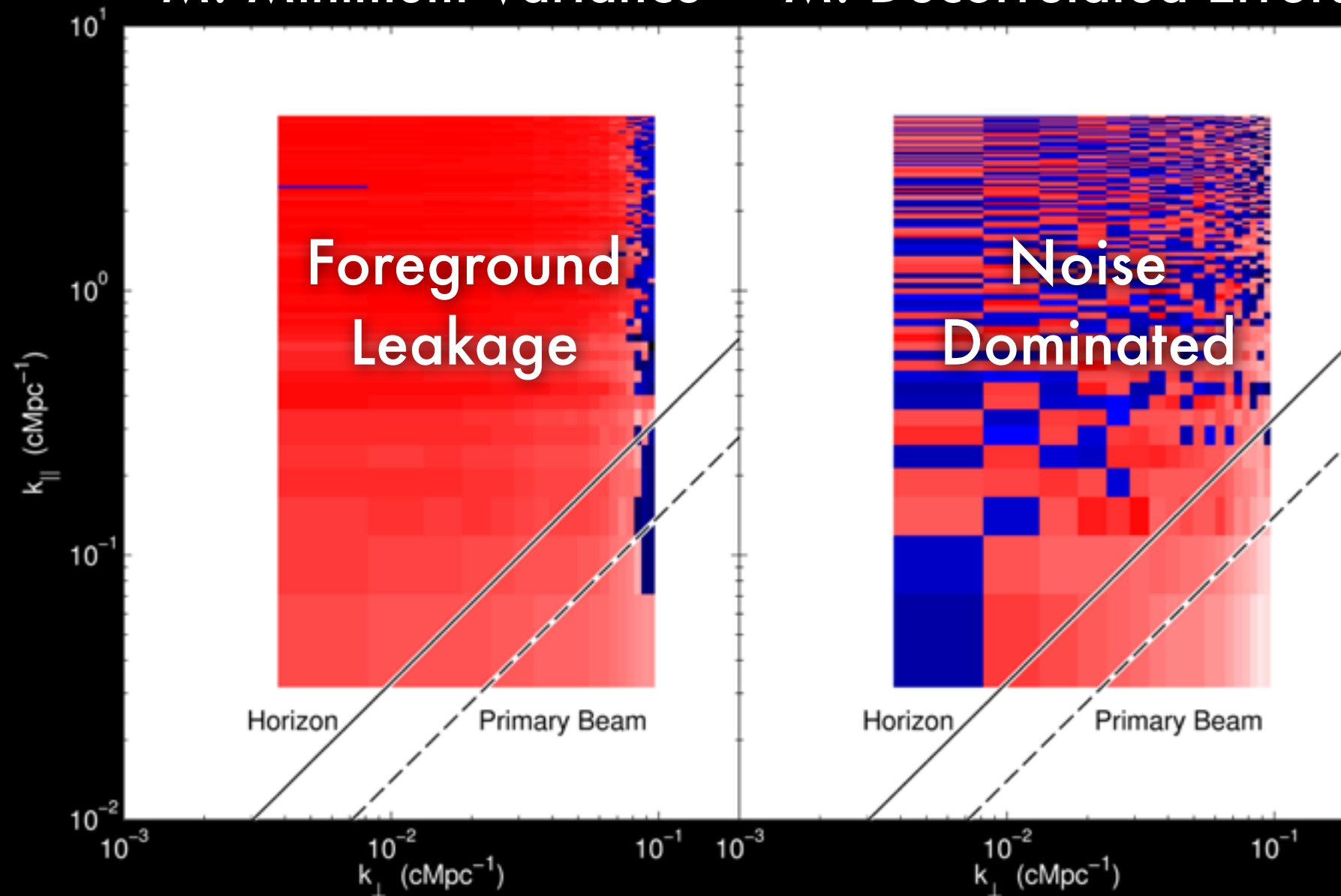


# A good estimator helps preserve the EoR Window.

$$\text{Cov}(\hat{\mathbf{p}}) = \mathbf{M}\mathbf{F}\mathbf{M}^\top$$

$\mathbf{M}$ : Minimum Variance

$\mathbf{M}$ : Decorrelated Errors



Cross Power  
Spectrum

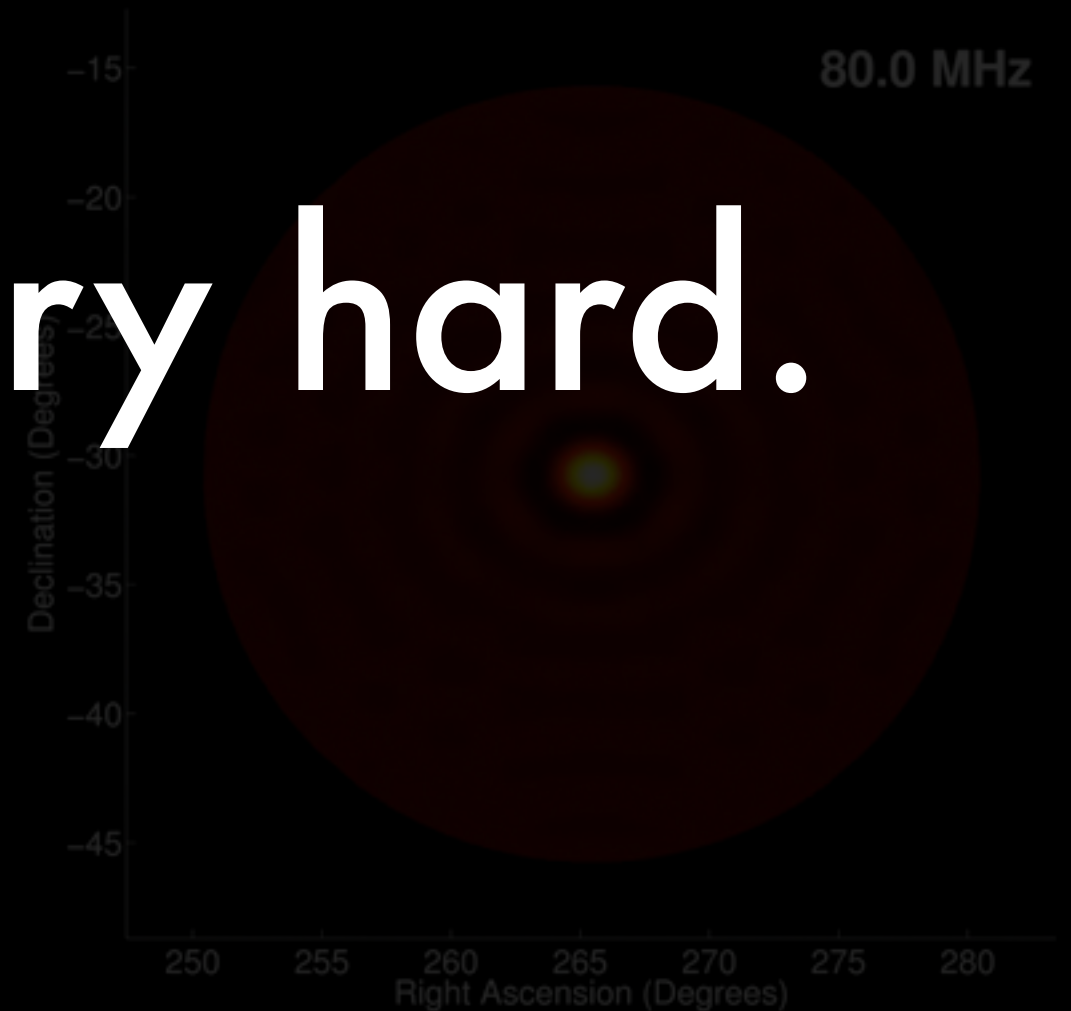


*Dillon et al.*  
(2014)

We also learned that we needed to better understand the noise and foregrounds covariances better.

We could try to precisely model our residuals and propagate them to uncertain instrument model...

But that's very hard.

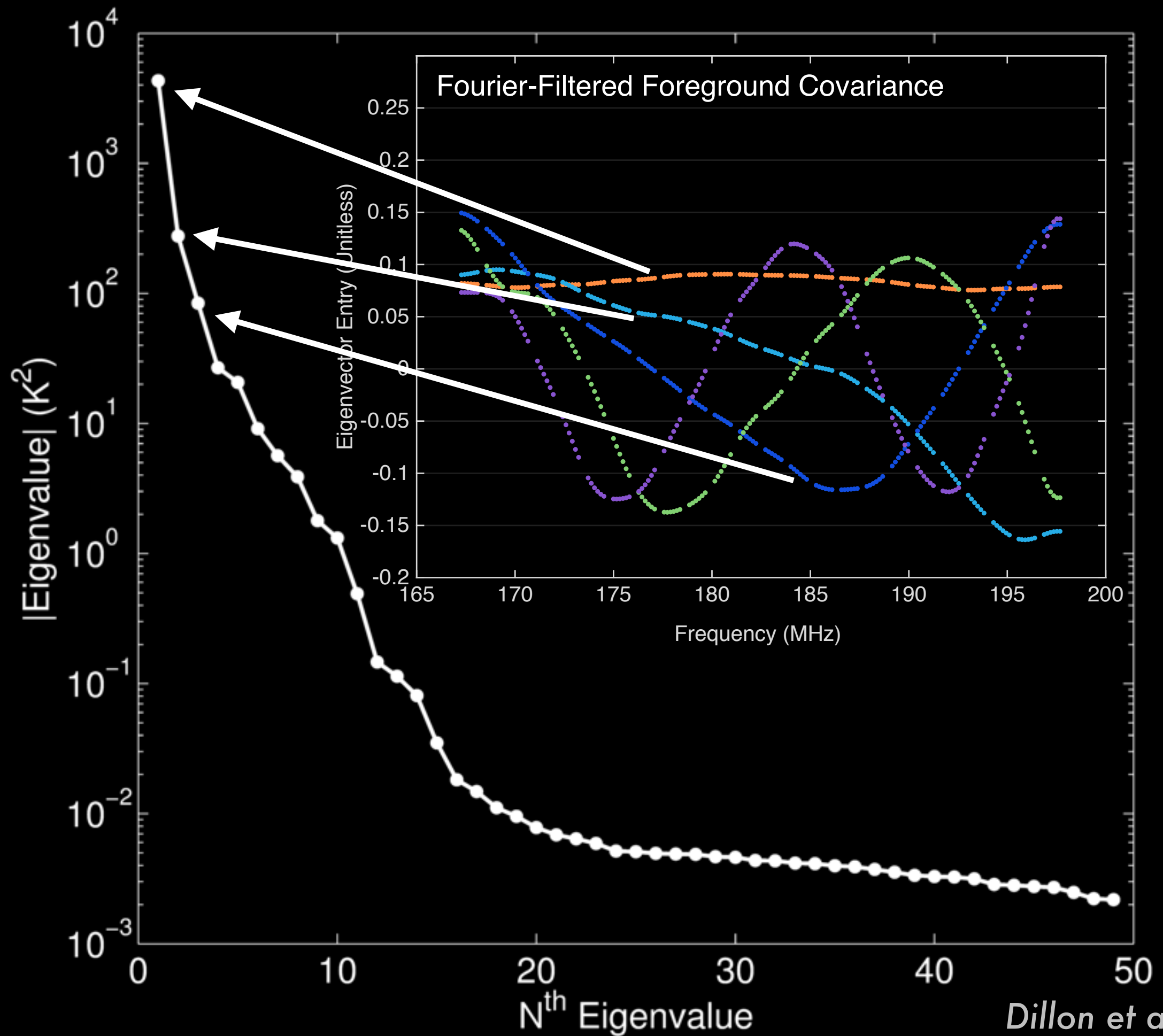


↓ Frequency

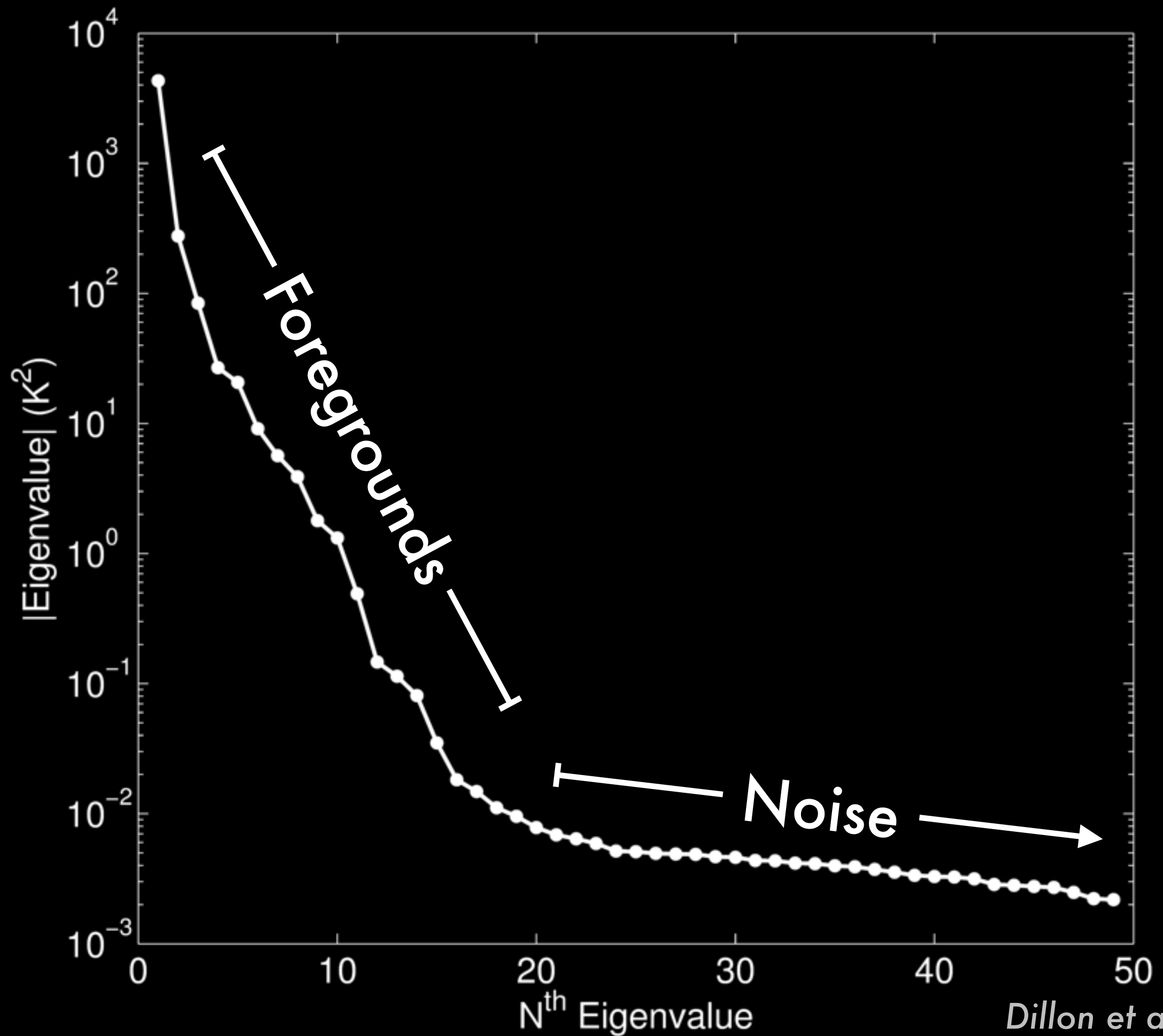
# Empirical Covariance Matrix of Foreground Residuals and Noise

Frequency →

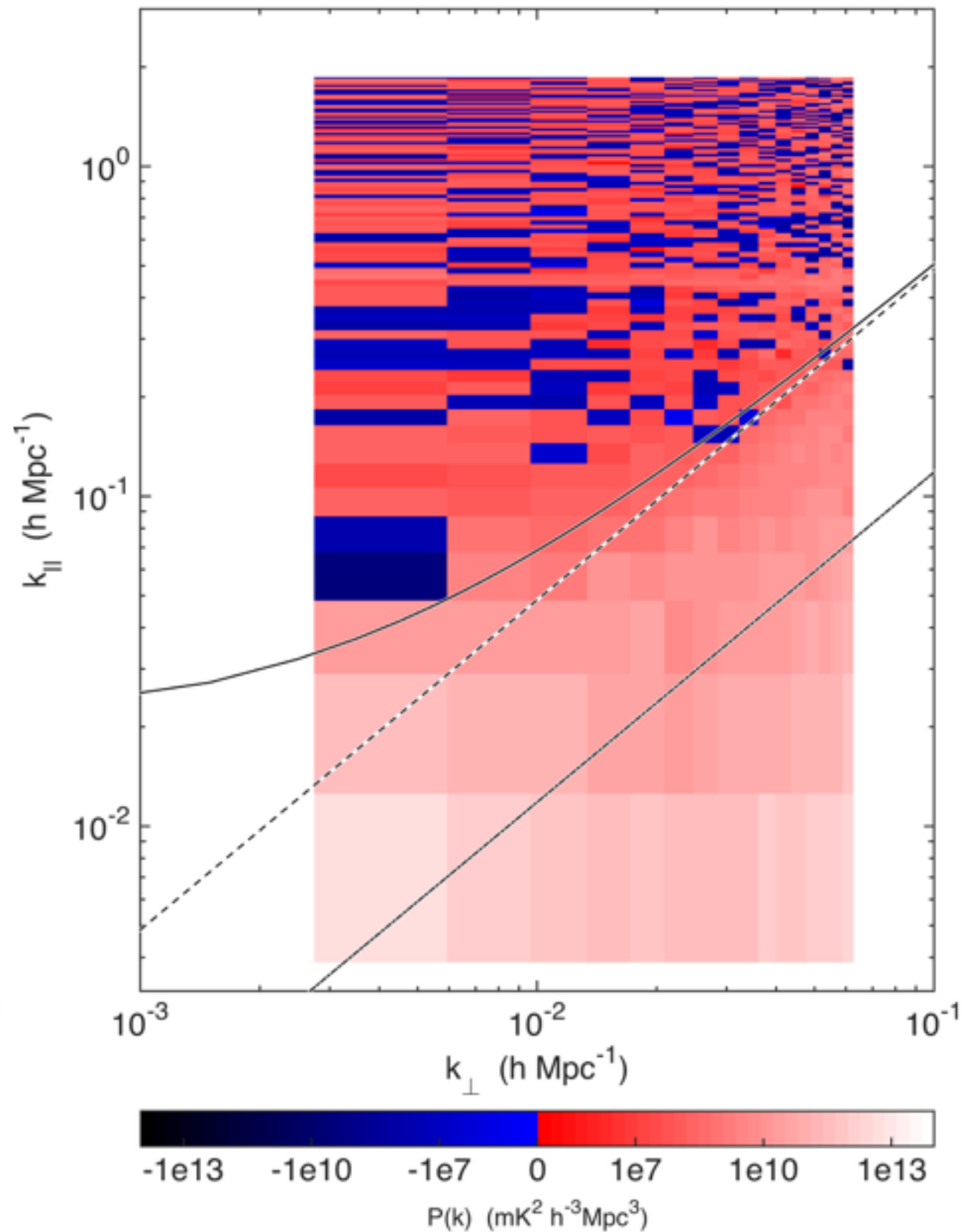
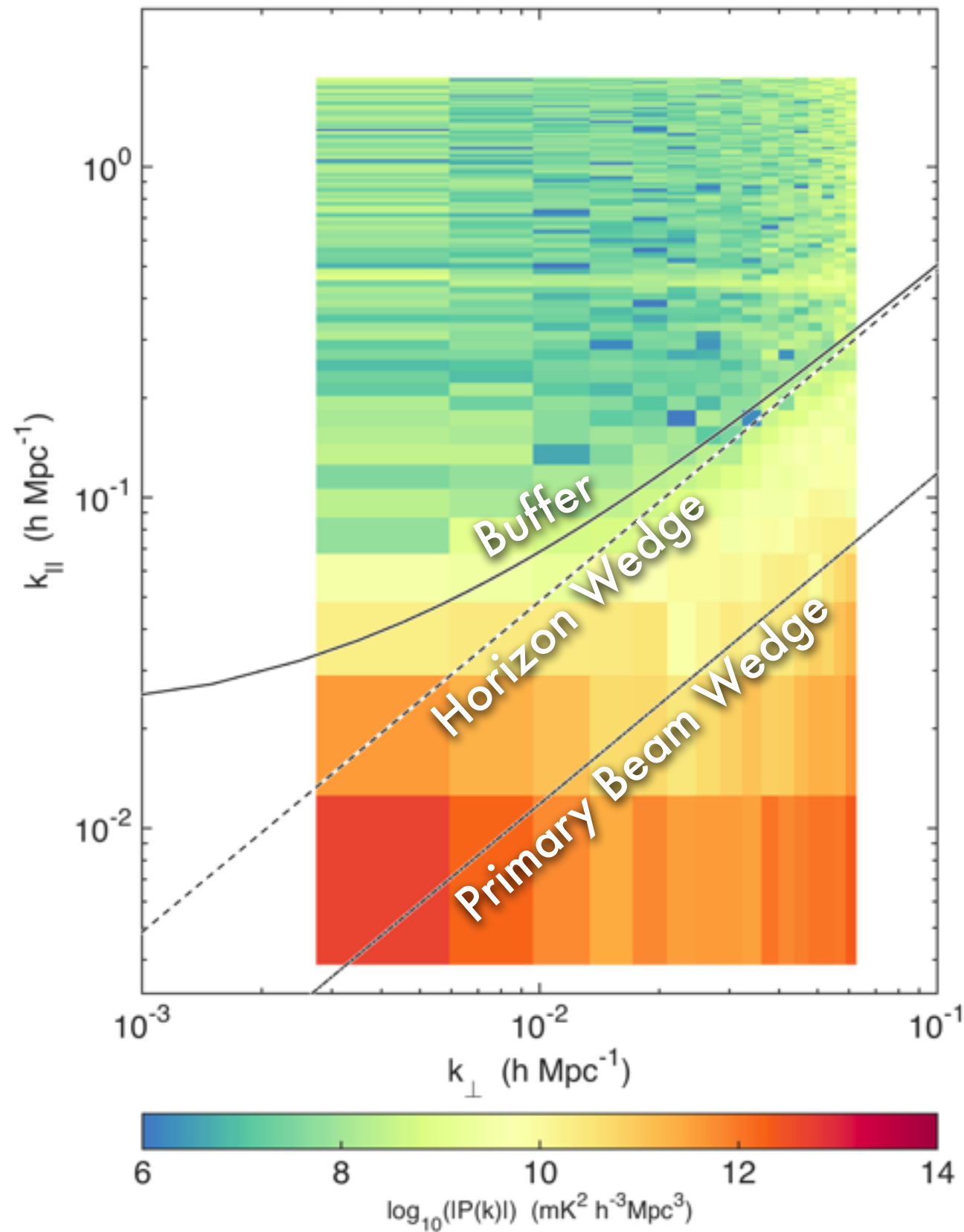
*Dillon et al. (2015)*



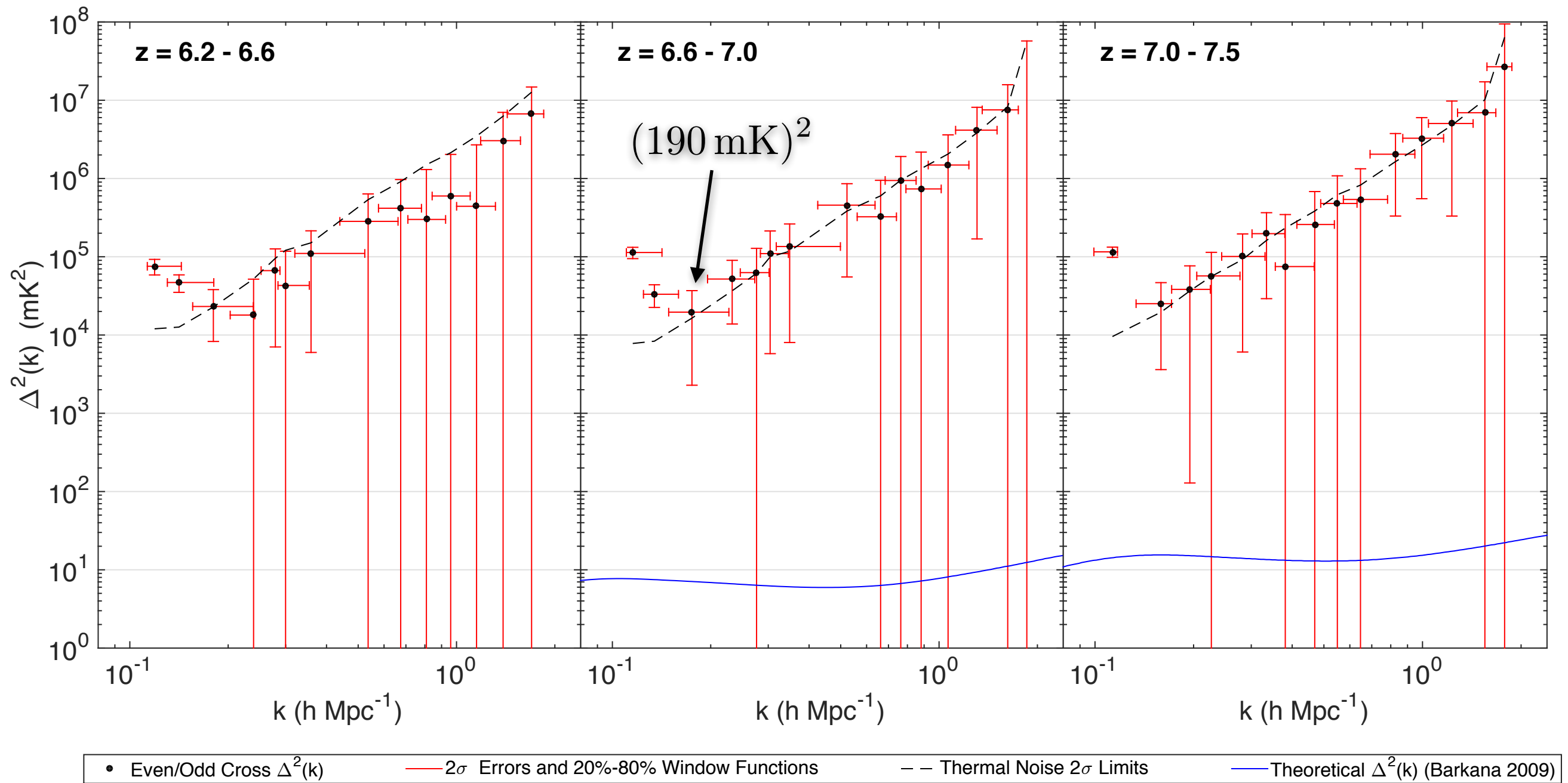




# 3 Hour MWA Observations at $z \approx 7$



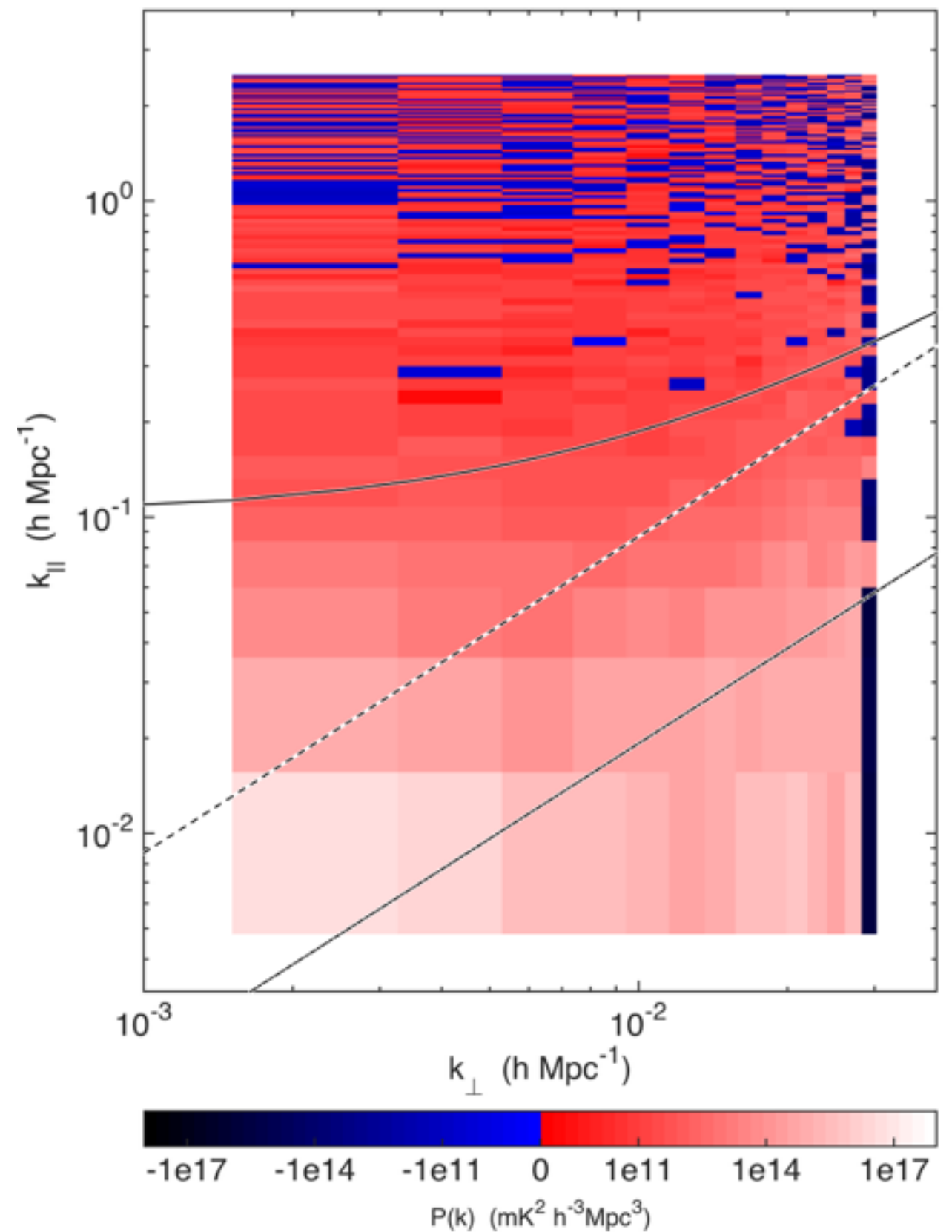
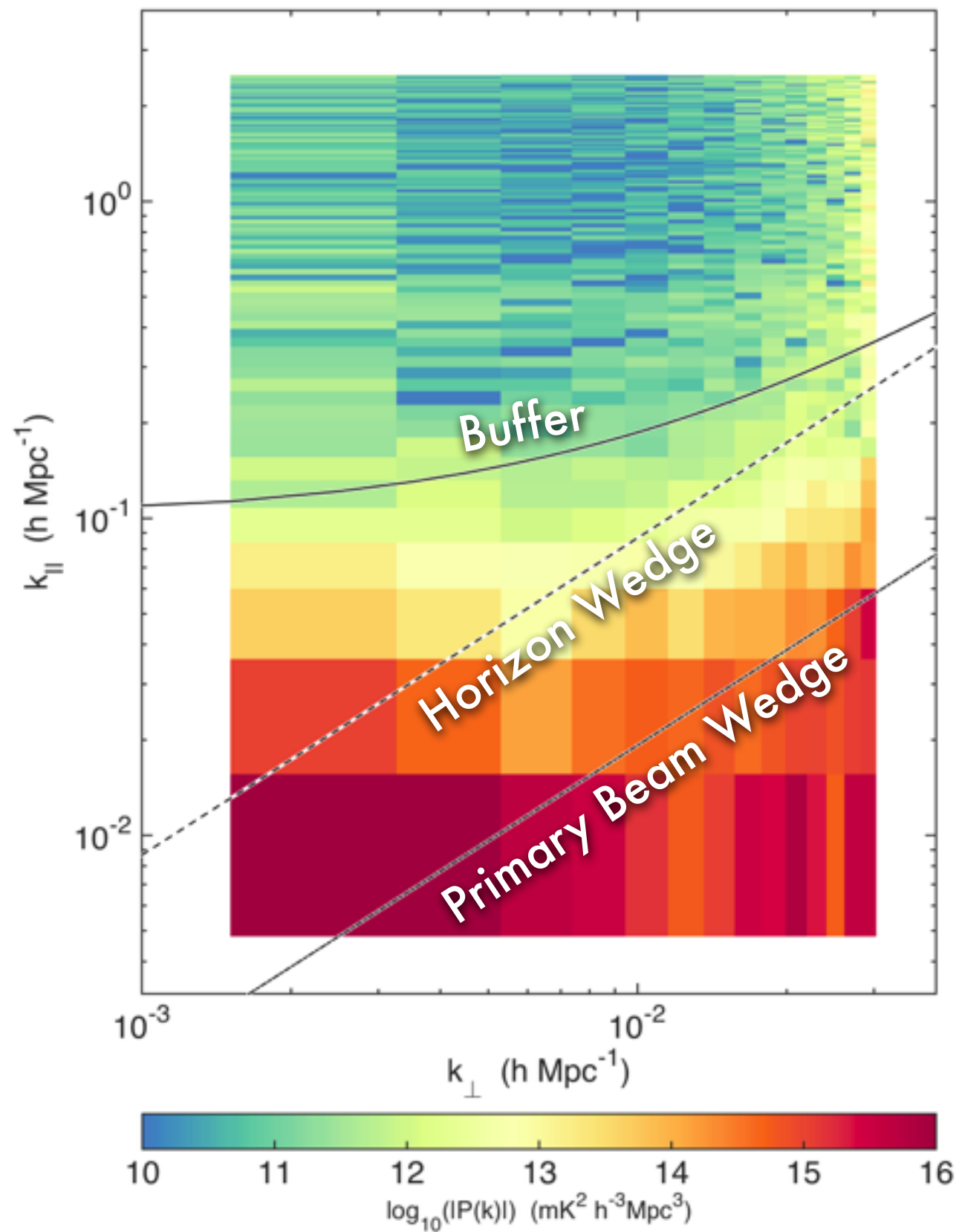
# 3 Hour MWA Observations at $z \approx 7$



Deeper integrations are coming (look for Beardsley et al. and Neben et al. next year.)

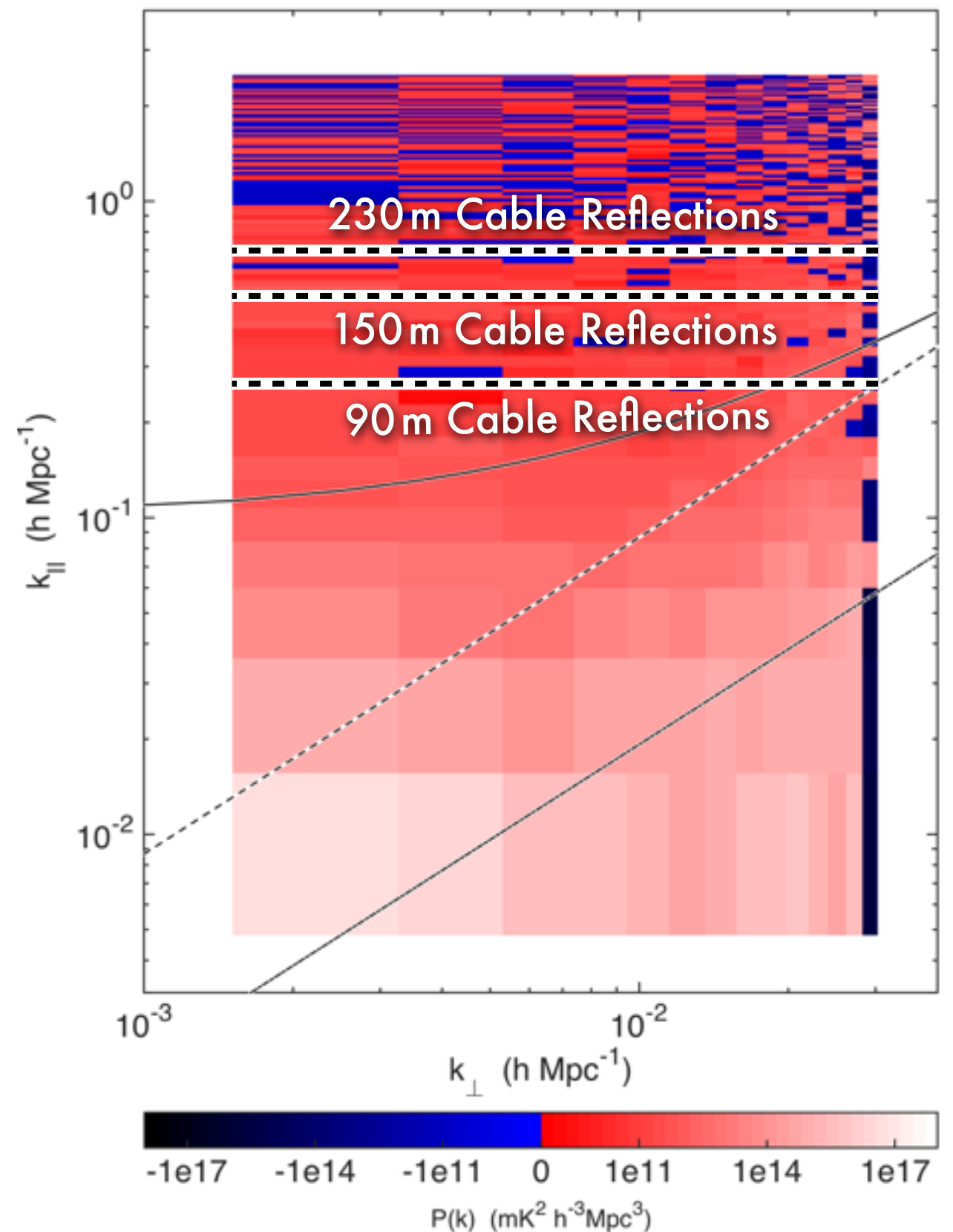
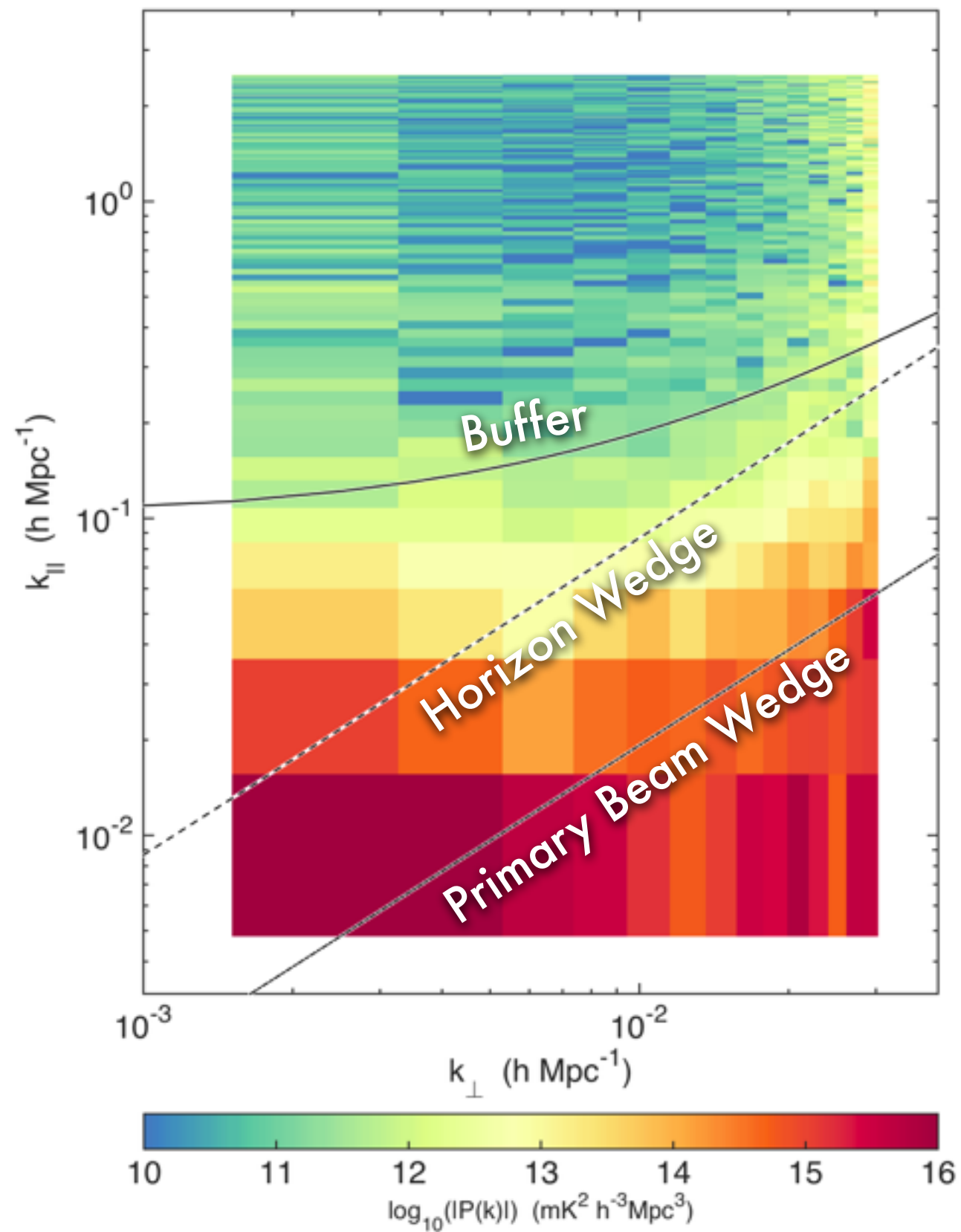


We've also observed at  $z \approx 16$  to study the EoX.



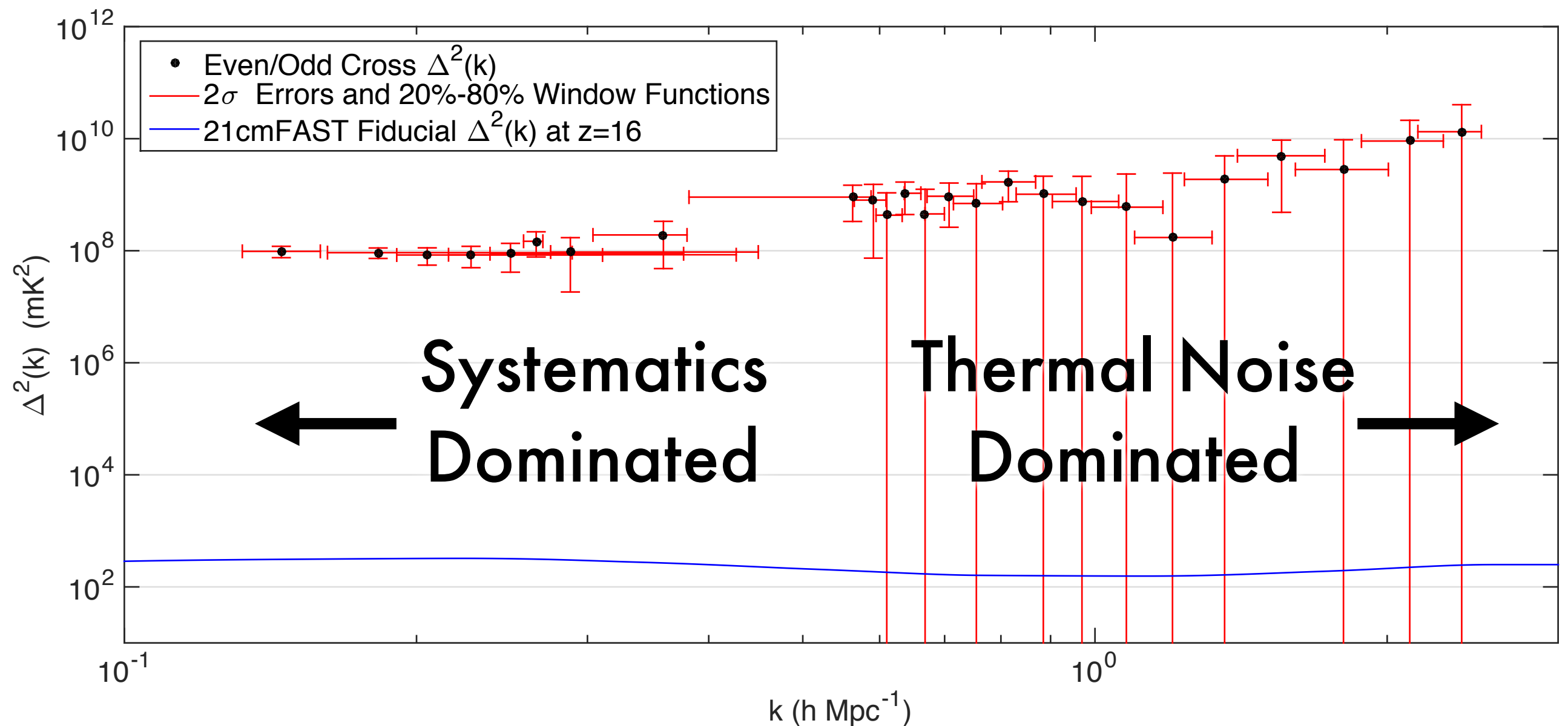
*Ewall-Wice, Dillon, et al. (in review)*

# We're limited by spectral structure in our bandpass.



*Ewall-Wice, Dillon, et al. (in review)*

Even with only a few hours of observation,  
bandpass structure limits our EoX power spectra.

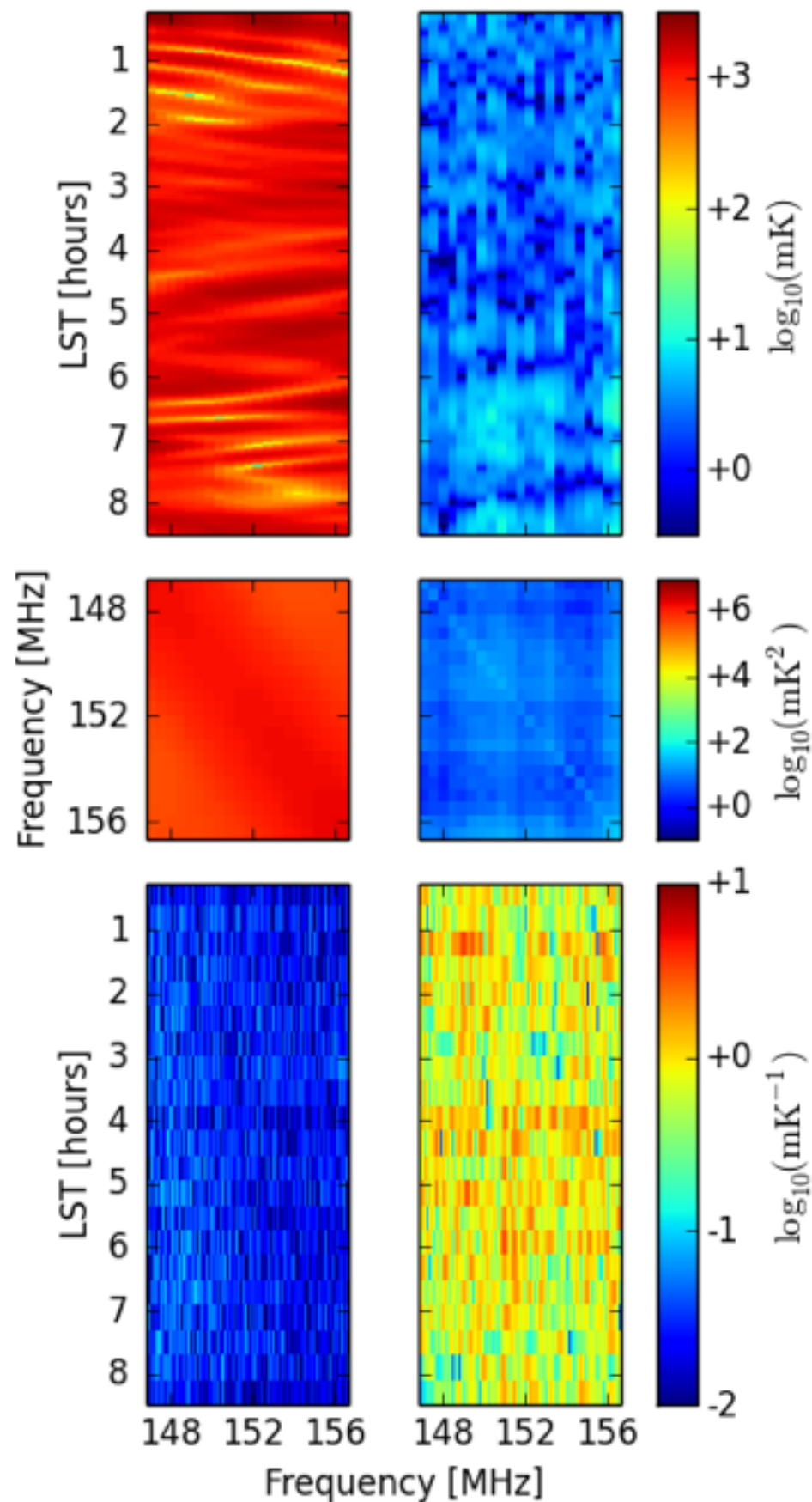


Limits:  $2.5 \times 10^7 \text{ mK}^2$ ,  $8.3 \times 10^7 \text{ mK}^2$ , and  $2.7 \times 10^8 \text{ mK}^2$  at  $z = 12.2$ ,  $15.4$ , and  $17.5$

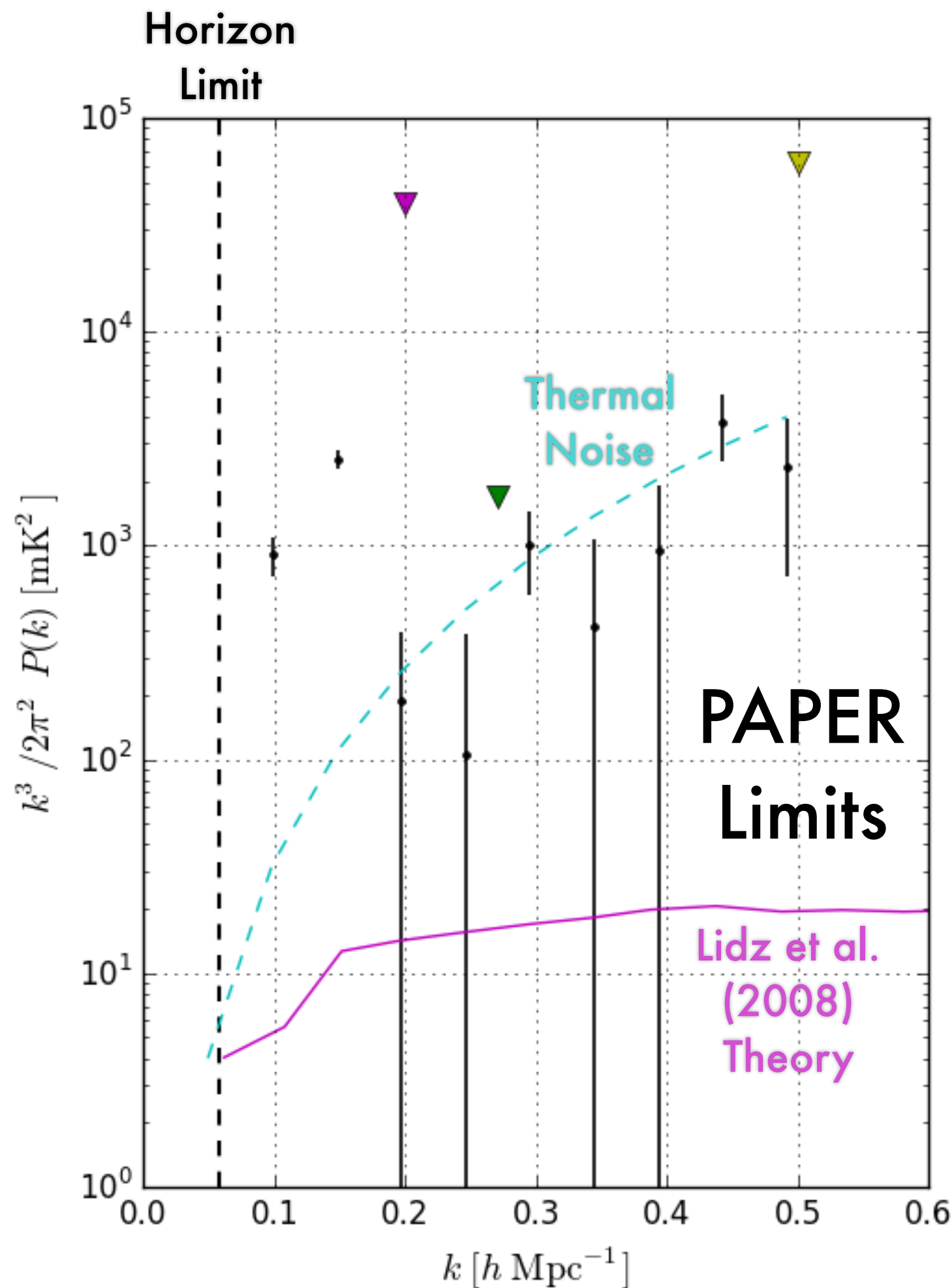


Raw  
Data

Delay-  
Filtered



The PAPER team, using a lot more data and the same empirical freq-freq covariance technique to downweight residual spectral structure...

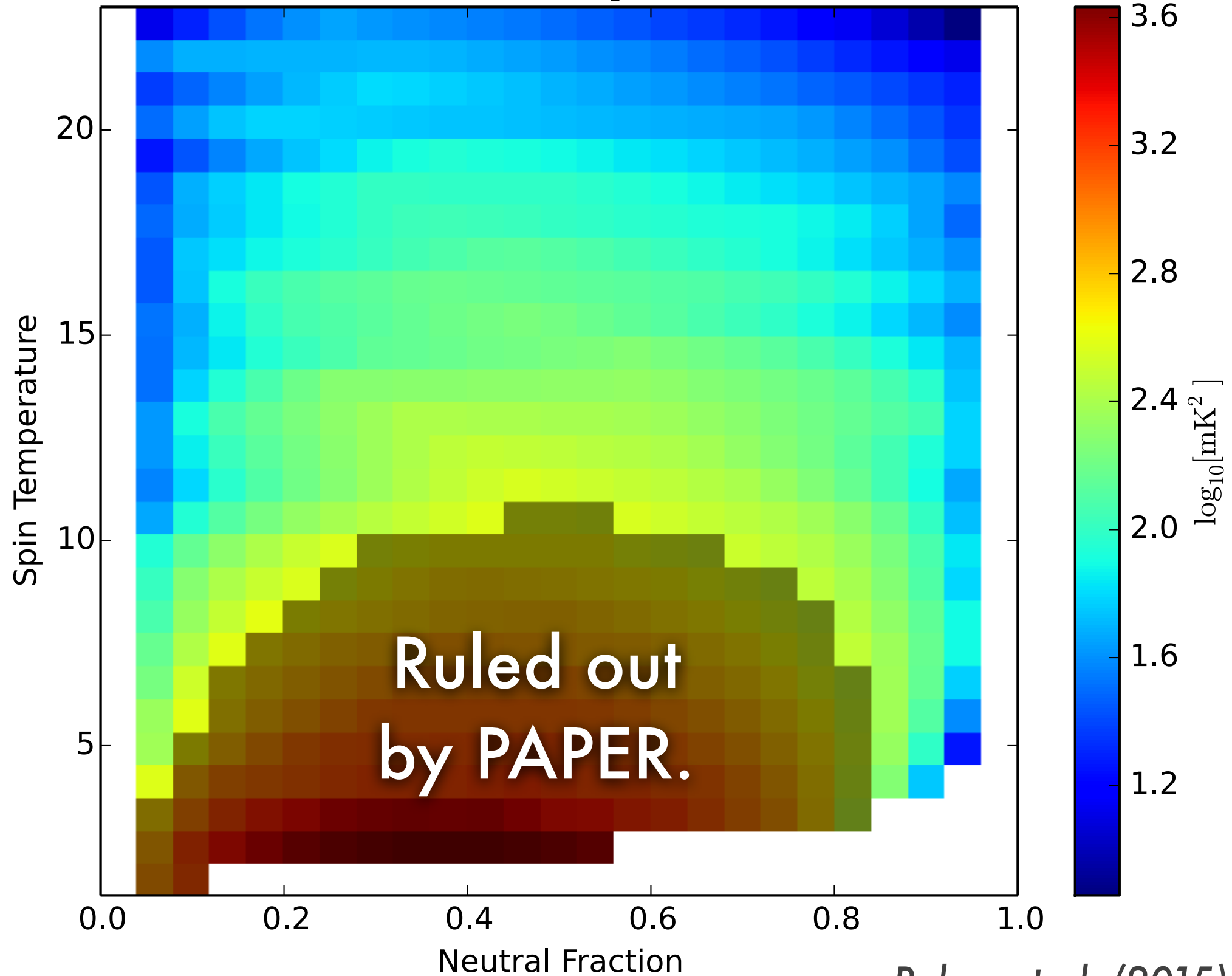


...set the best limits  
on the 21 cm power  
spectrum to date:  
 $\Delta^2(k) < (22 \text{ mK})^2$   
at  $2\sigma$ ,  $z = 8.4$ , and  
 $0.15 < k < 0.5 h \text{ Mpc}^{-1}$ .

$$\delta T_{21\text{ cm}} \propto x_{\text{HI}}(1 + \delta) \left[ 1 - \frac{T_{\text{CMB}}}{T_s} \right]$$

$$k = 0.25 h \text{Mpc}^{-1}$$

**PAPER-64  
results  
constrain the  
IGM spin  
temperature  
at  $z = 8.4$ .**



*Pober et al. (2015)*

# Our upper limits keep marching down...



[REMOVED UNPUBLISHED FIGURE]

(PRELIMINARY)







We hope for results this year, but that will be it for PAPER<sub>6</sub> since PAPER has been replaced by 4..

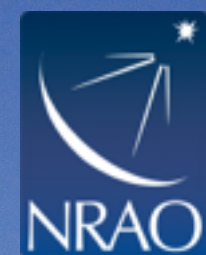
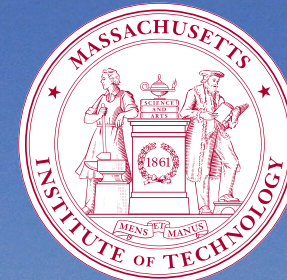
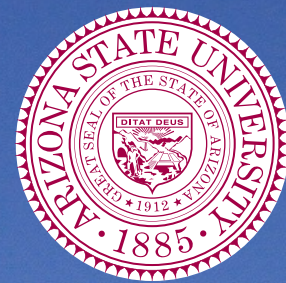








CAL POLY POMONA



SCUOLA  
NORMALE  
SUPERIORE



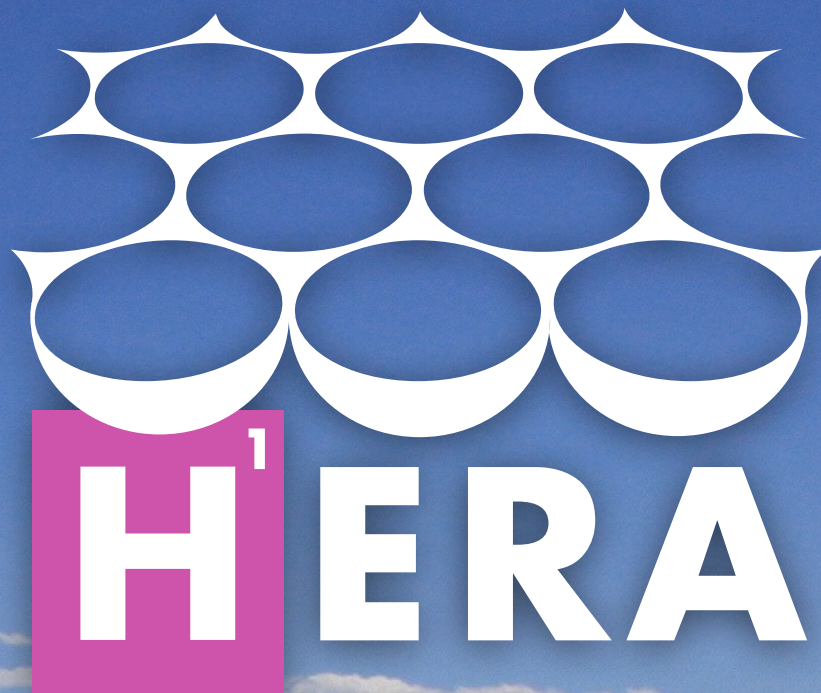
UNIVERSITY OF  
CAMBRIDGE



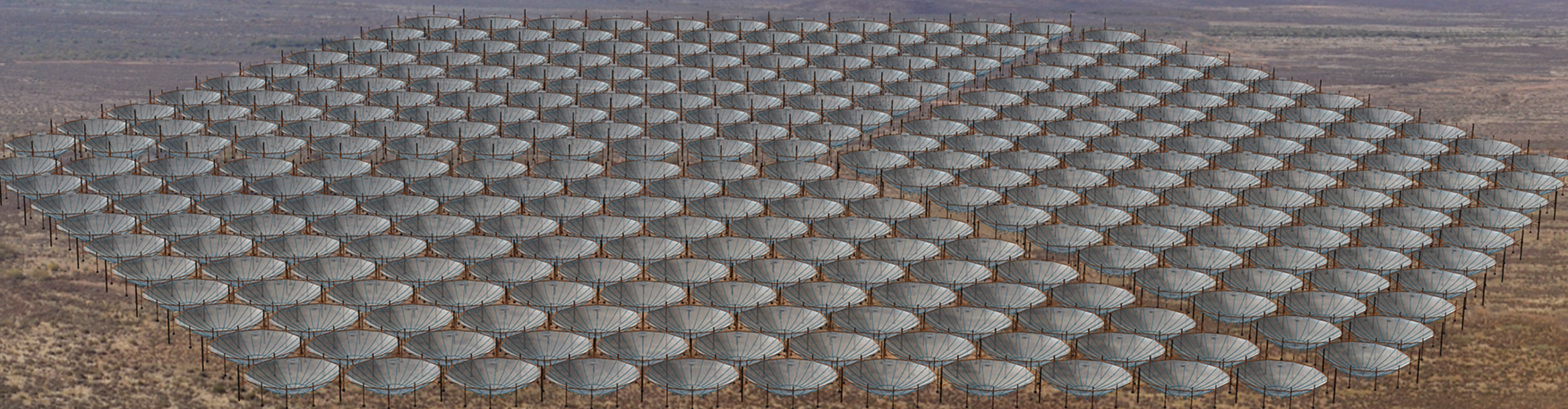
Penn  
UNIVERSITY of PENNSYLVANIA



BROWN



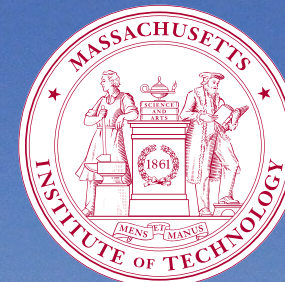
# The Hydrogen Epoch of Reionization Array







CAL POLY POMONA



SCUOLA  
NORMALE  
SUPERIORE



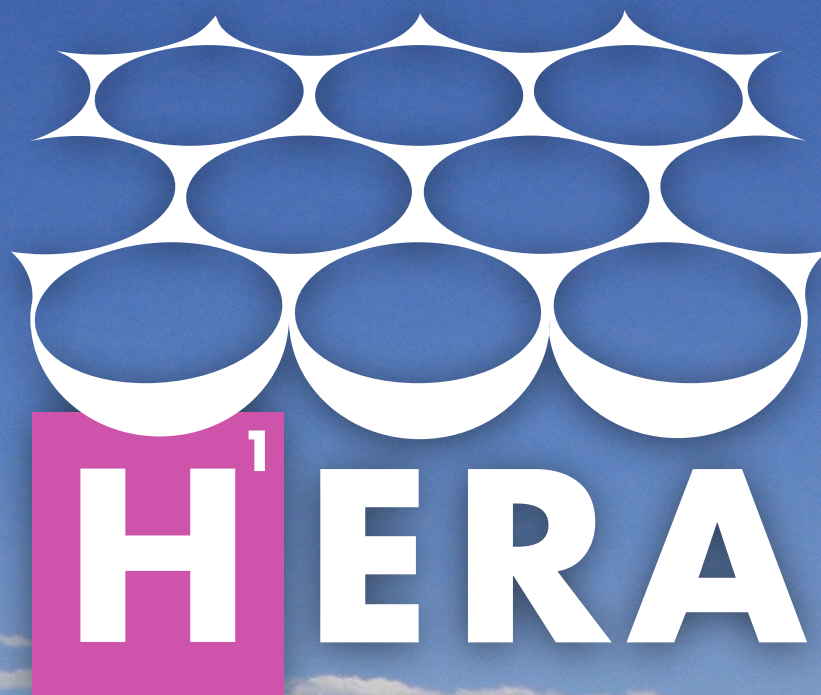
UNIVERSITY OF  
CAMBRIDGE



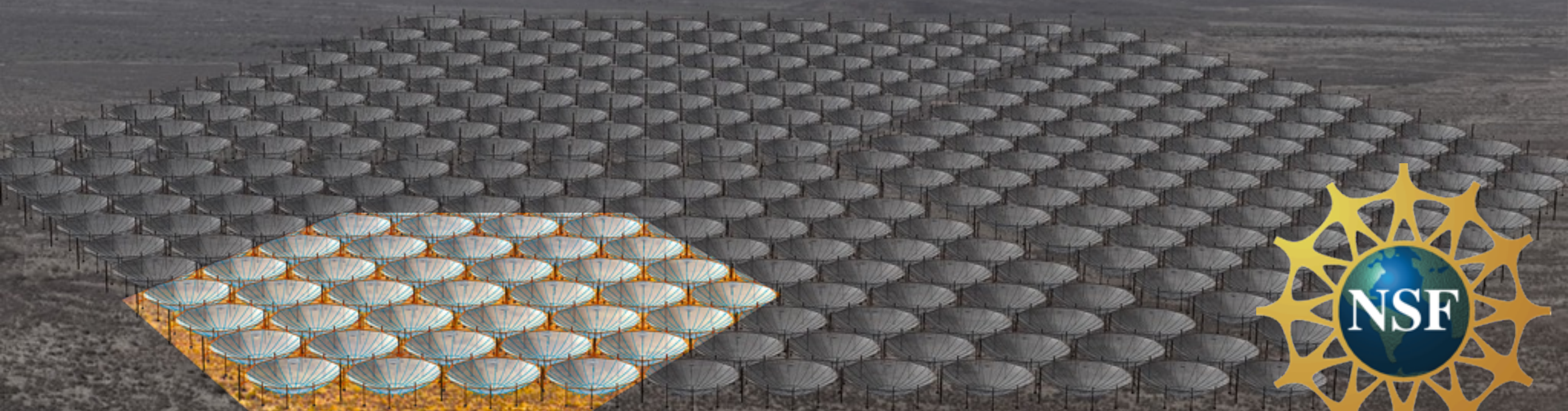
Penn  
UNIVERSITY OF PENNSYLVANIA



BROWN



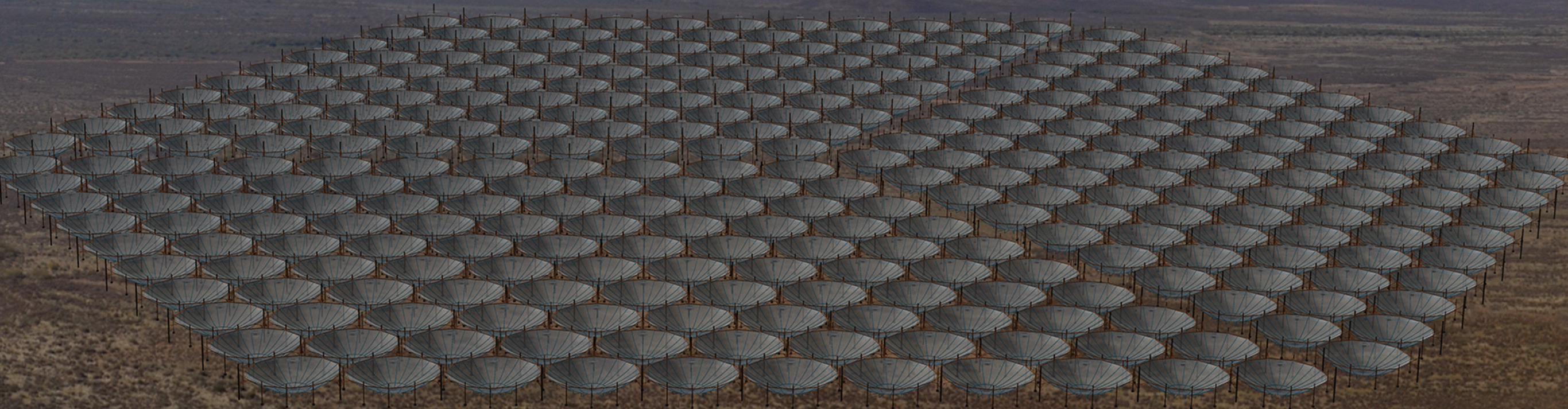
# The Hydrogen Epoch of Reionization Array





# **H<sup>1</sup>** ERA will have:

- 350 stationary dishes that vastly increase sensitivity at the cost of field of view.





The first 19 HERA elements in are now  
being commissioned in South Africa

14 m diameter dishes

An aerial photograph of the Murchison Widefield Array (MWA) in South Africa. The image shows a vast array of 14-meter diameter radio telescope dishes arranged in a grid pattern across a dry, open landscape. A group of people is standing near one of the dishes in the foreground for scale. The text "14 m diameter dishes" is overlaid on the image with a white line indicating the diameter of one of the dishes. In the background, there are more dishes and a small blue building. The sky is blue with some clouds.





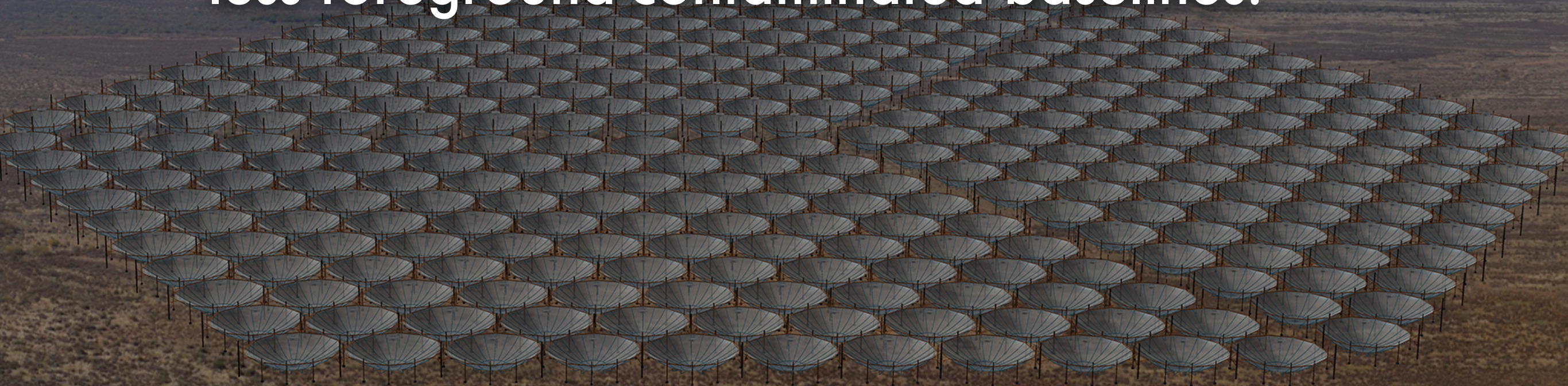
## The HERA Stripe

HERA is a drift scan instrument that maps out a stripe of constant declination.



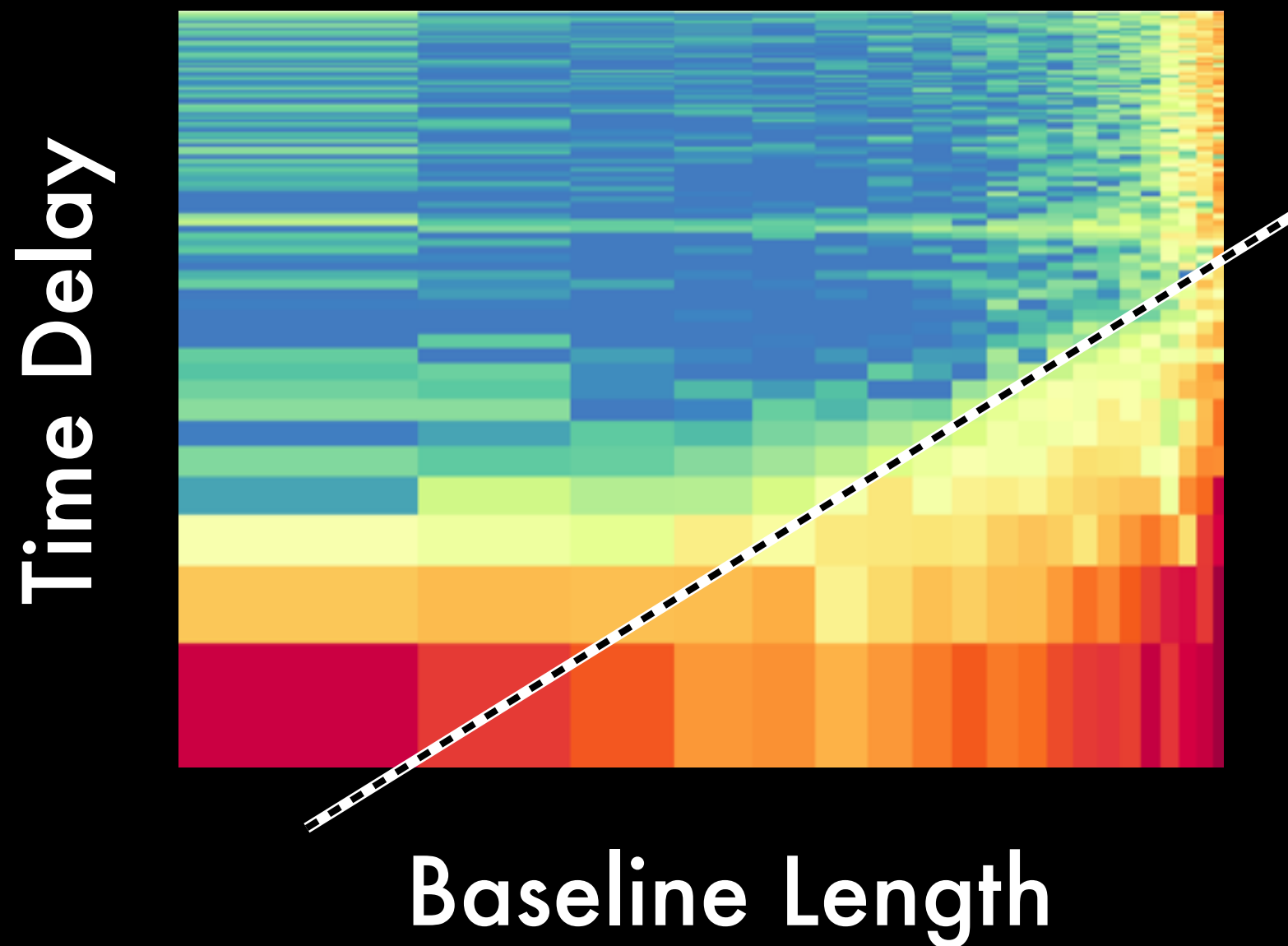
# **H<sup>1</sup>** ERA will have:

- 350 stationary dishes that vastly increase sensitivity, at the cost of field of view.
- Compact design with high sensitivity to short, less foreground-contaminated baselines.





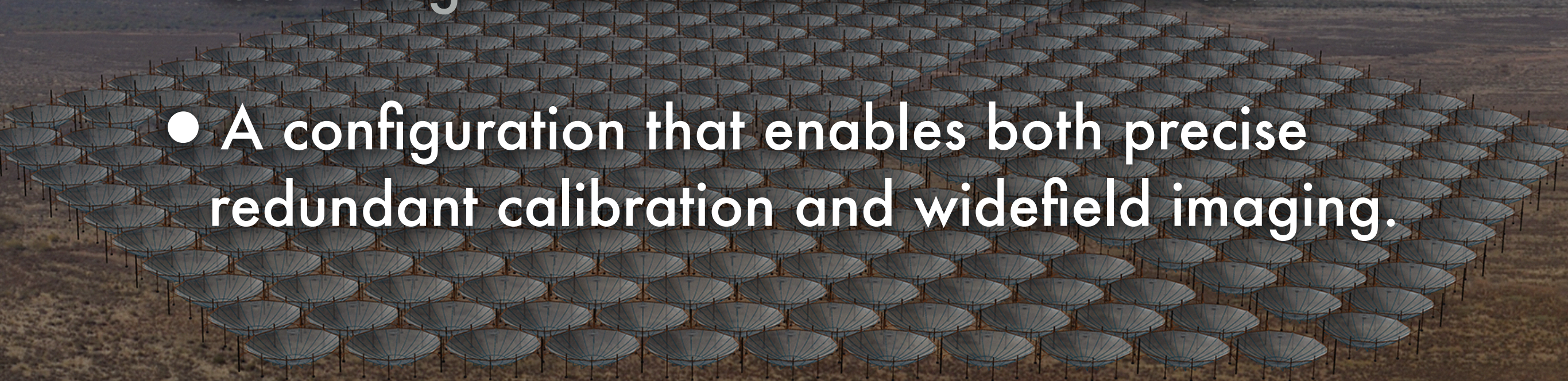
Recall, shorter baselines have “less wedge” in them.





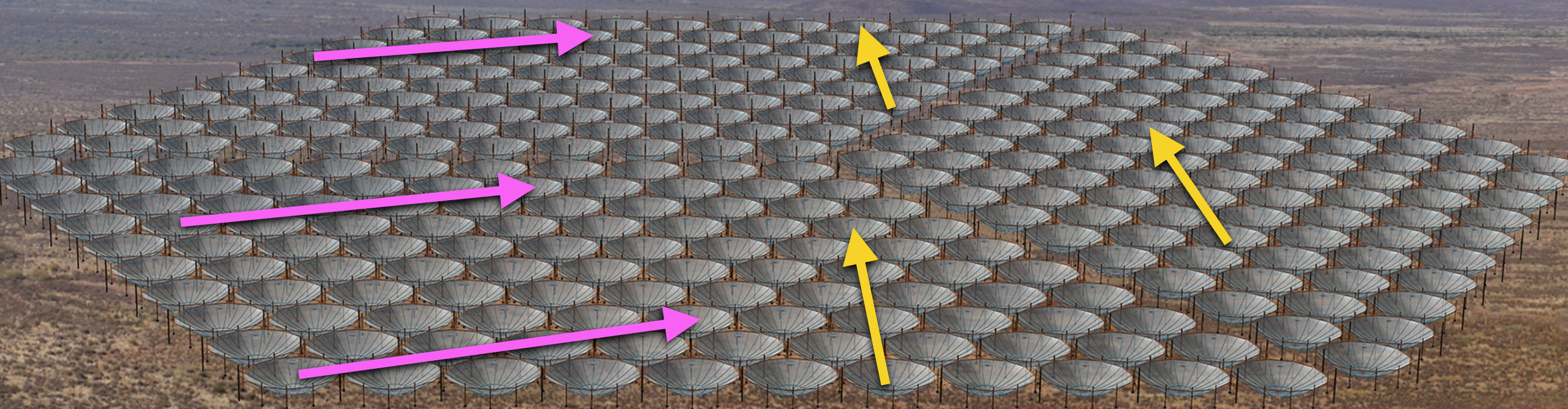
# **HERA** will have:

- 350 stationary dishes that vastly increase sensitivity, at the cost of field of view.
- Compact design with high sensitivity to short, less foreground-contaminated baselines.
- A configuration that enables both precise redundant calibration and widefield imaging.





Redundant baselines enable precision calibration without a good sky model.

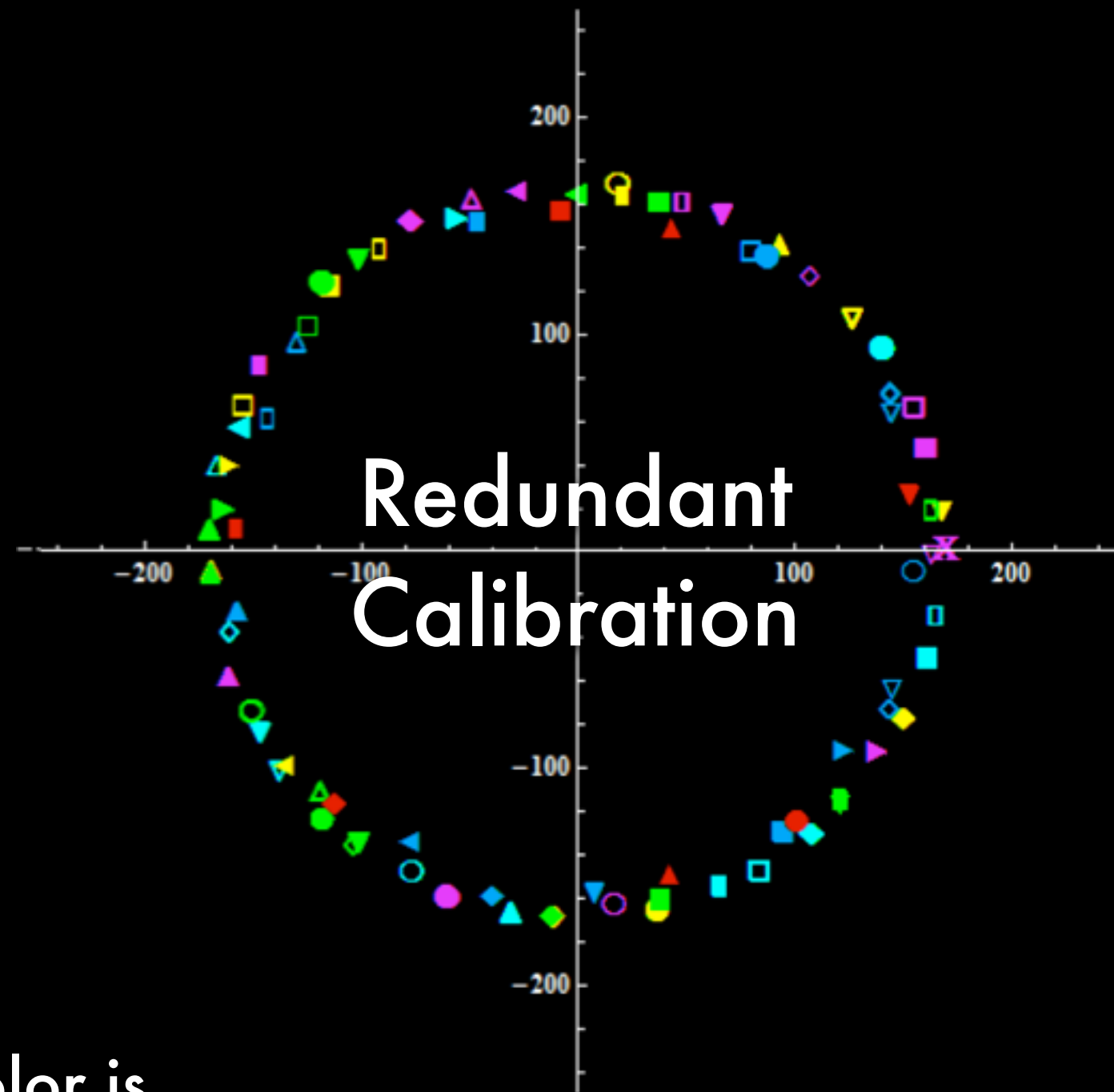




**MITEoR: a prototype highly-scalable  
interferometer for 21 cm cosmology.**

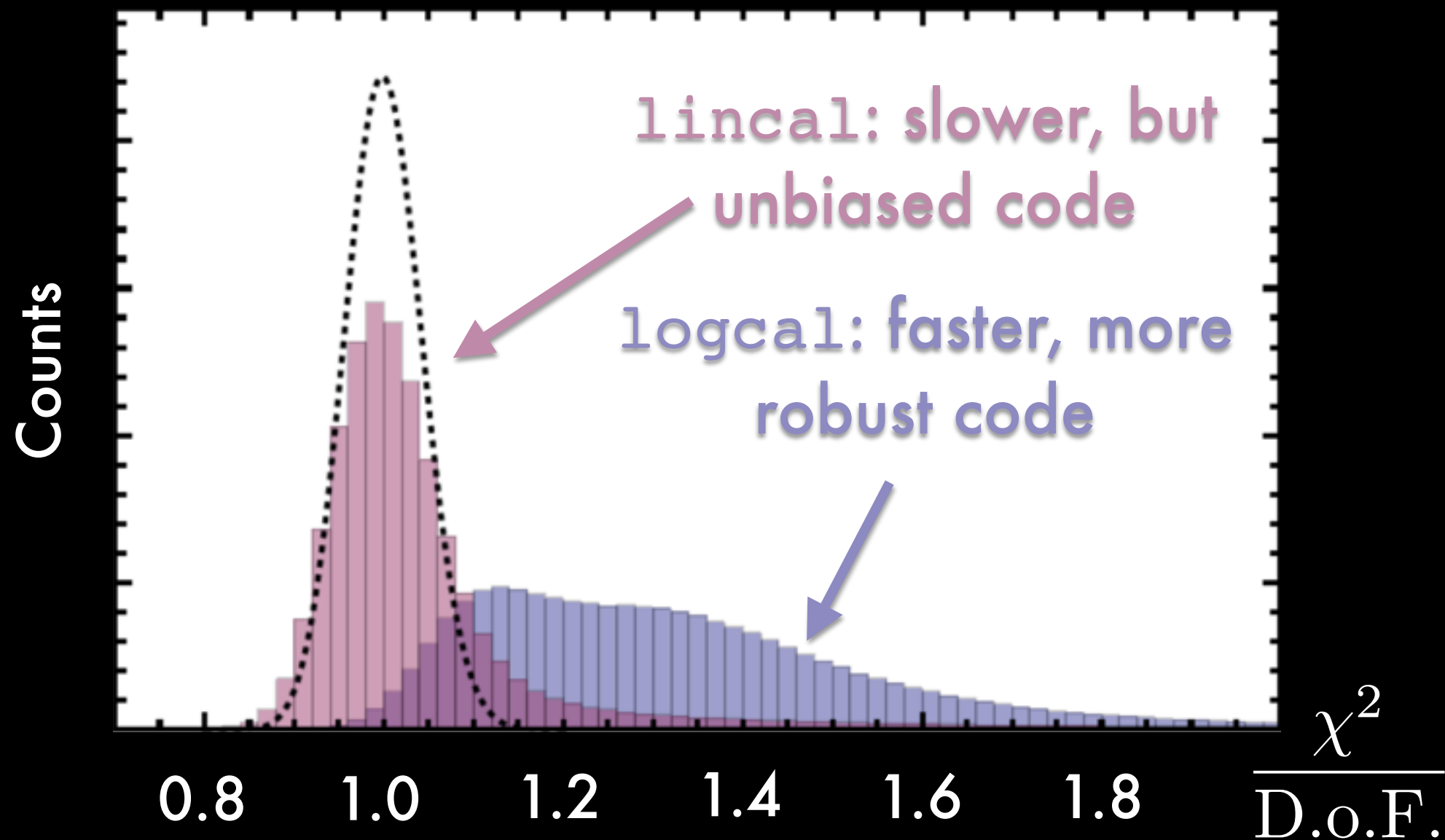


Redundant baselines allow us to quickly and precisely calibrate the amplitudes and phases of every antenna.

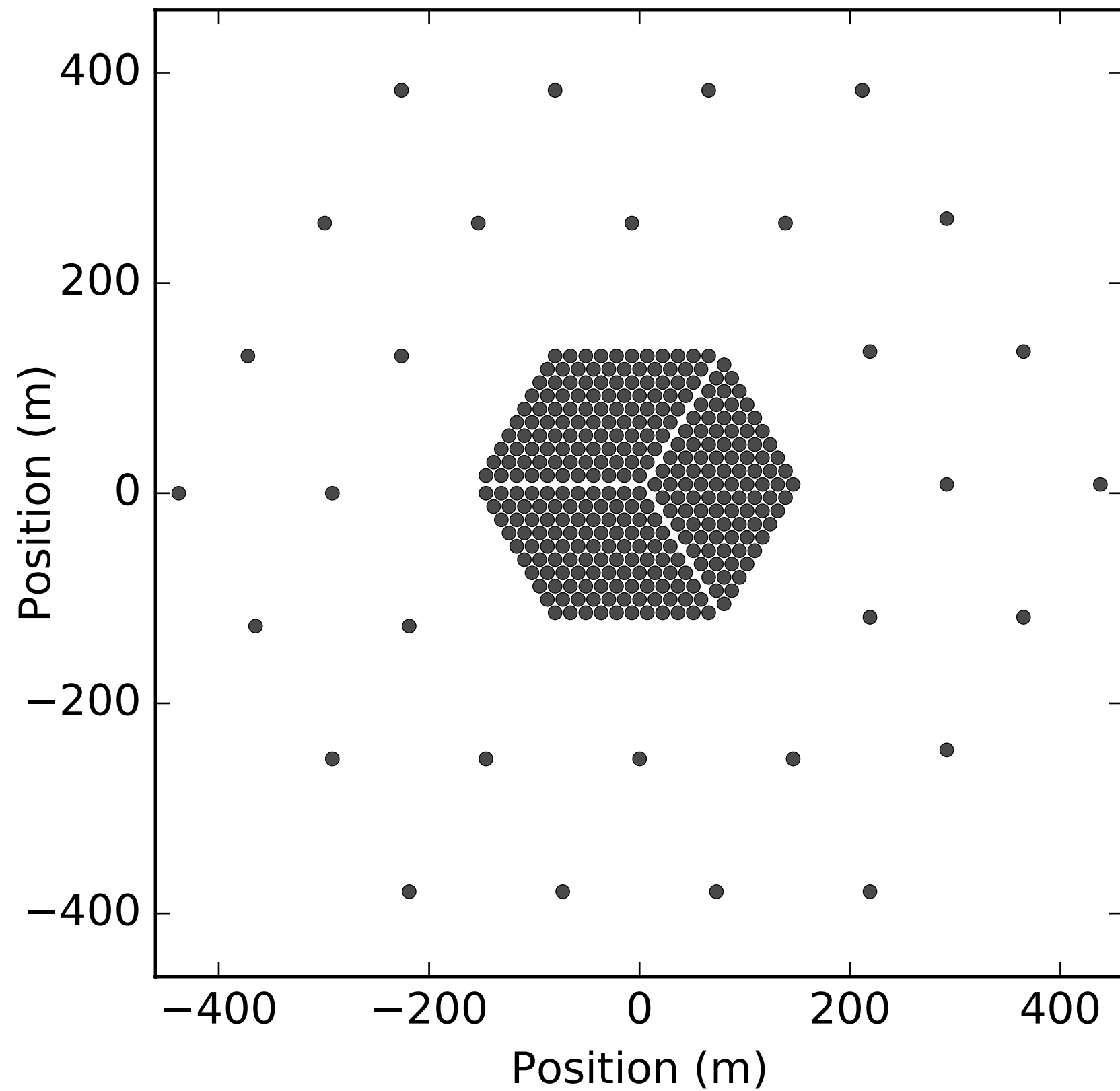


Each shape/color is a unique baseline.

Redundant baselines allow for a quantitative test of calibration and the real-time identification of problems.

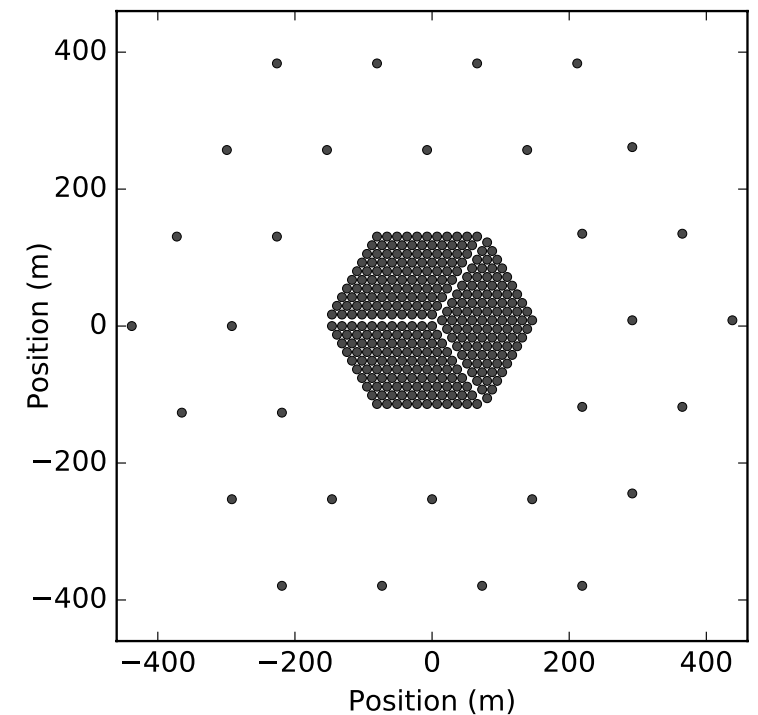
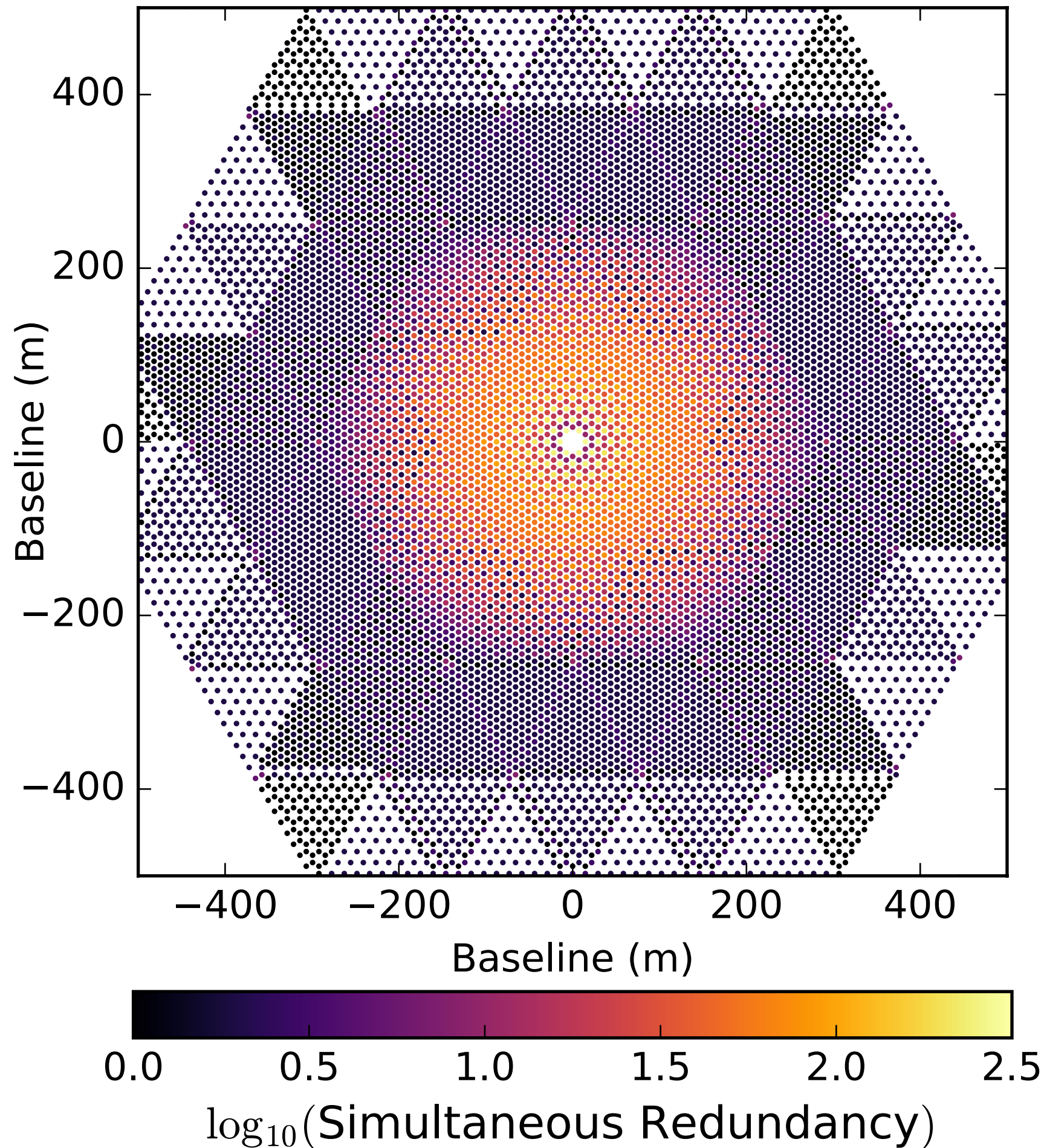


$$\chi^2 = \sum_{\text{all baselines}} \left[ (g_i g_j^*) V_{i,j}^{\text{fit}} - V_{i,j}^{\text{measured}} \right] / \sigma^2$$



**HERA's split  
configuration  
enables**

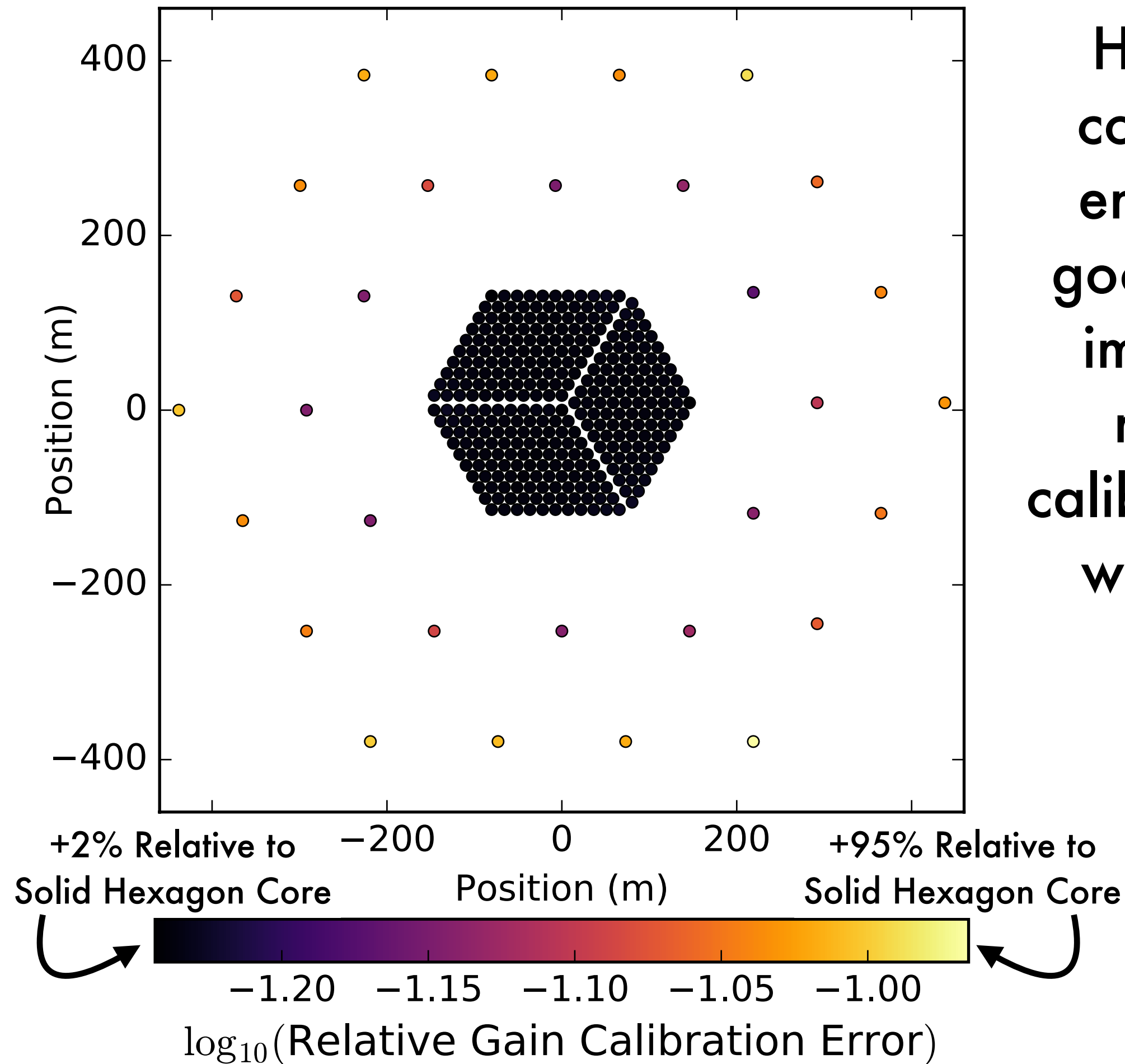
**HERA's split  
configuration  
enables both  
good widefield  
imaging**



*Dillon & Parsons (2016)*

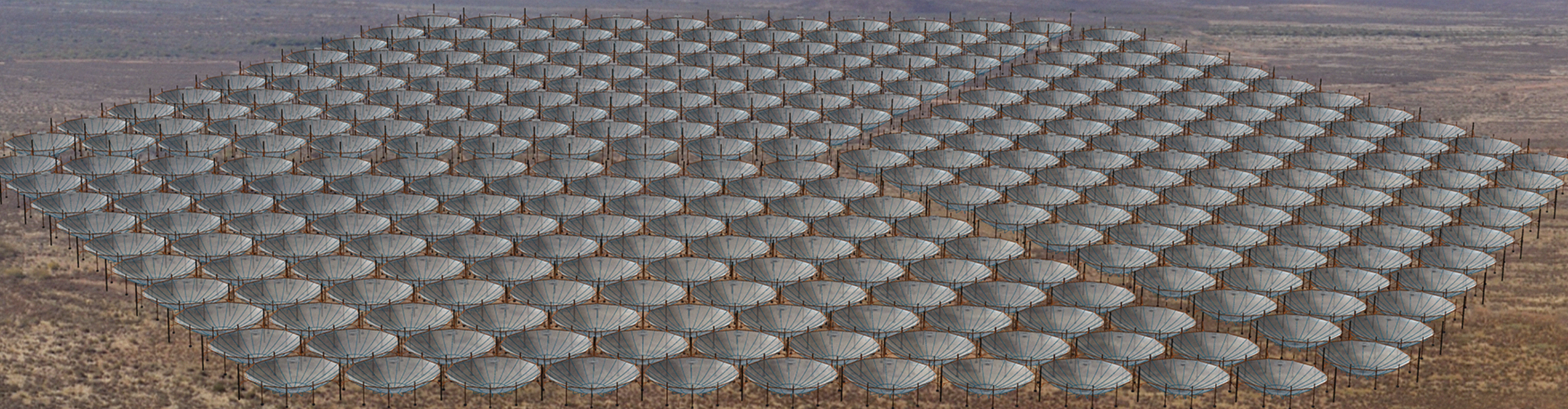


HERA's split configuration enables both good widefield imaging and redundant calibration of the whole array.





So, what can we expect  
to learn with HERA?





# We'll have the collecting area to confidently detect the EoR.

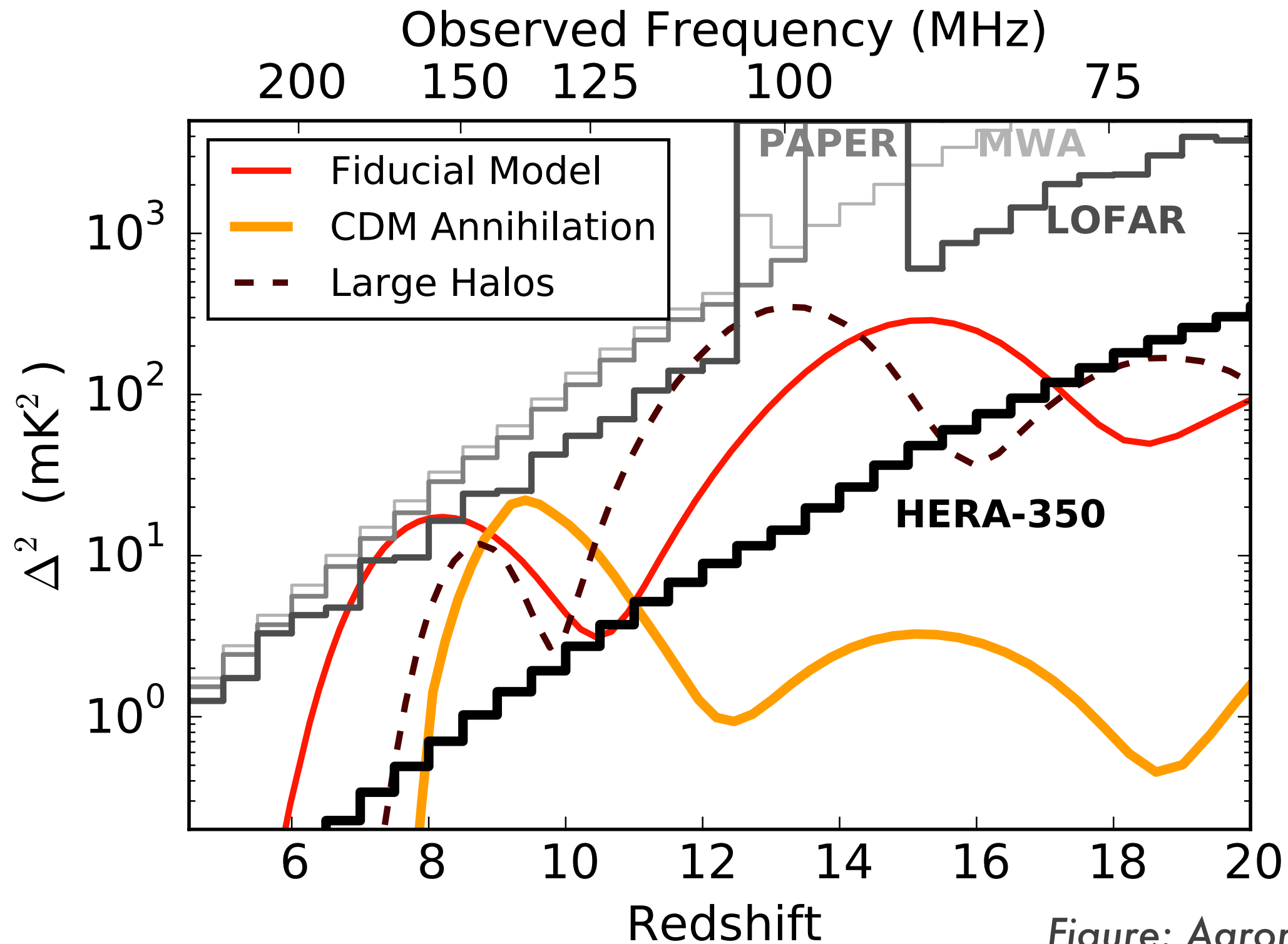
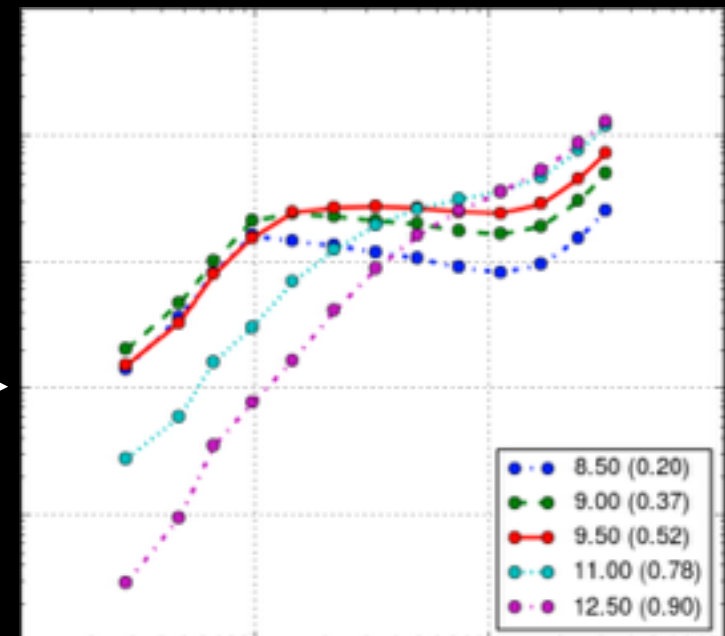
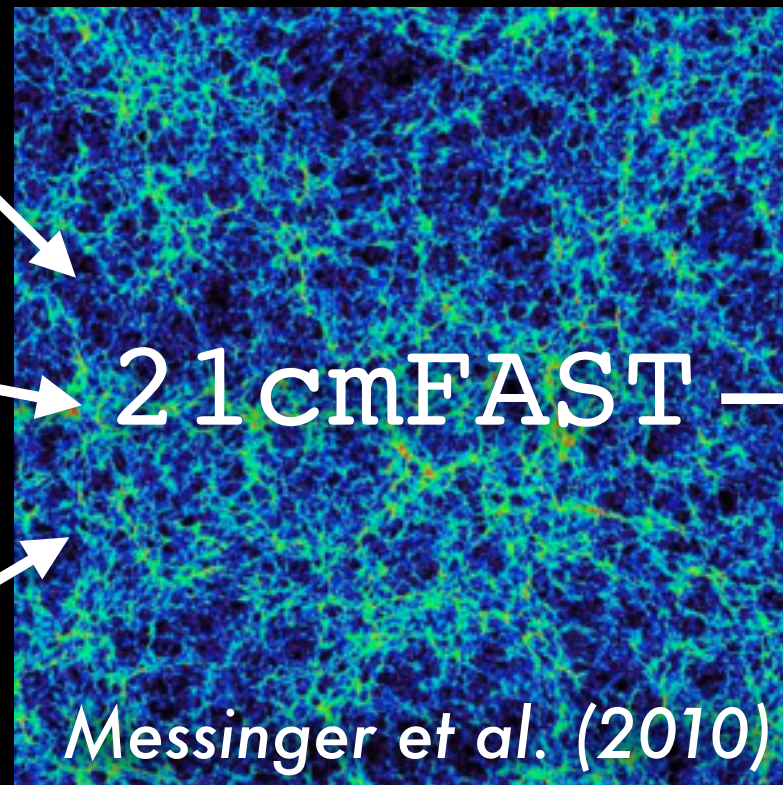


Figure: Aaron Ewall-Wice

# And we'll also provide the first tight constraints on the astrophysics underlying reionization.

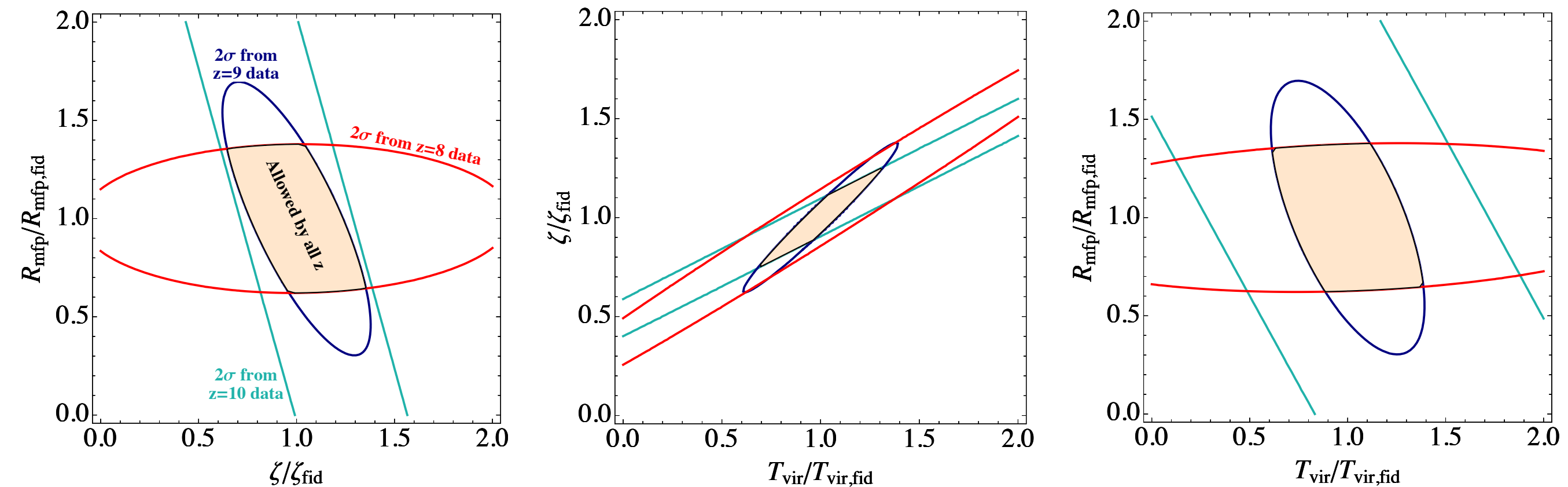
- $\zeta$ : Ionizing efficiency
- $R_{\text{mfp}}$ : Mean free path of ionizing photons
- $T_{\text{vir}}$ : Minimum virial temperature (and thus mass) of ionizing galaxies



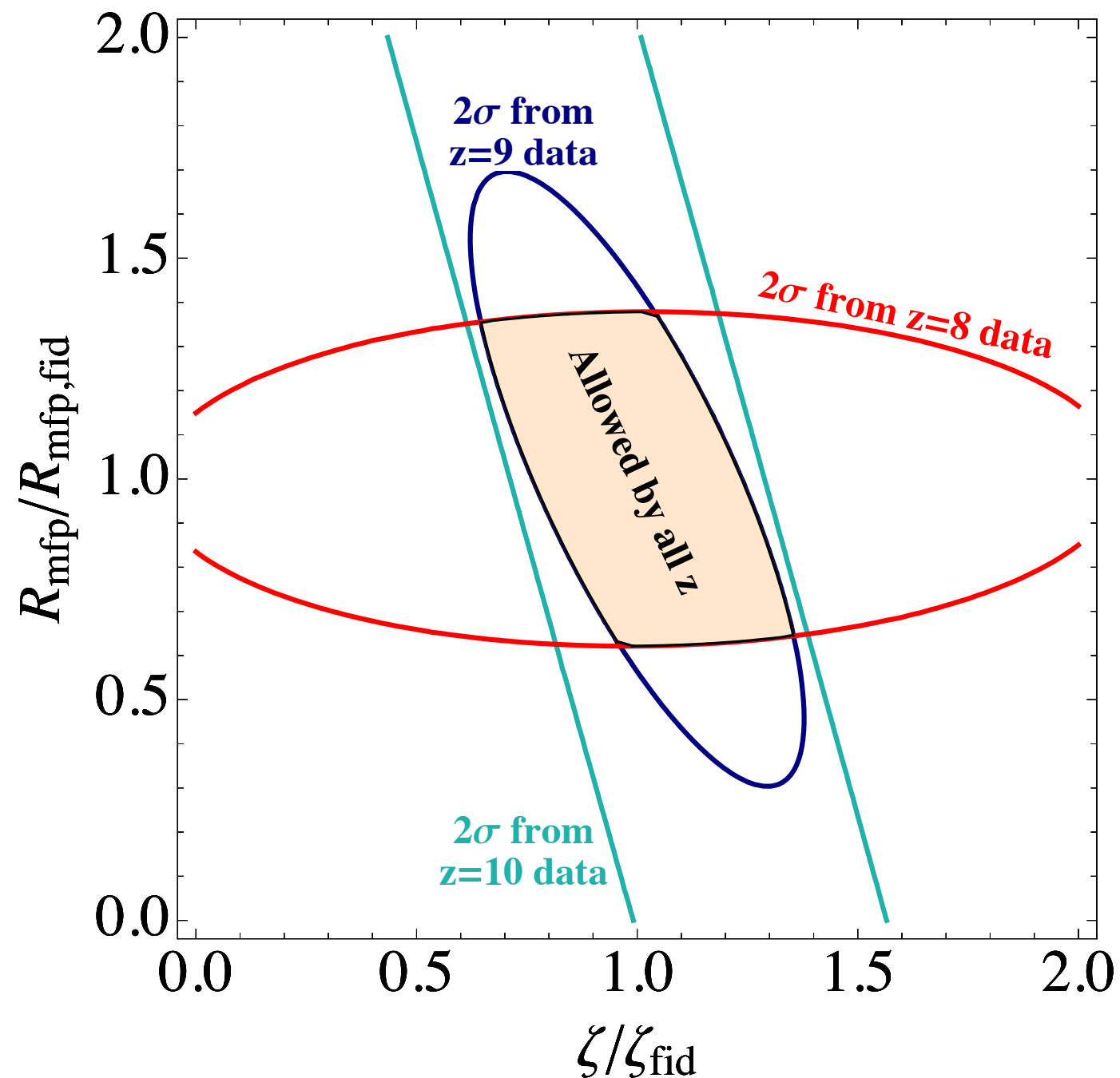
Qualitatively different 1D Power Spectra as a function of  $k$  and  $z$



# Using a Fisher matrix analysis, we can jointly constrain all three parameters...

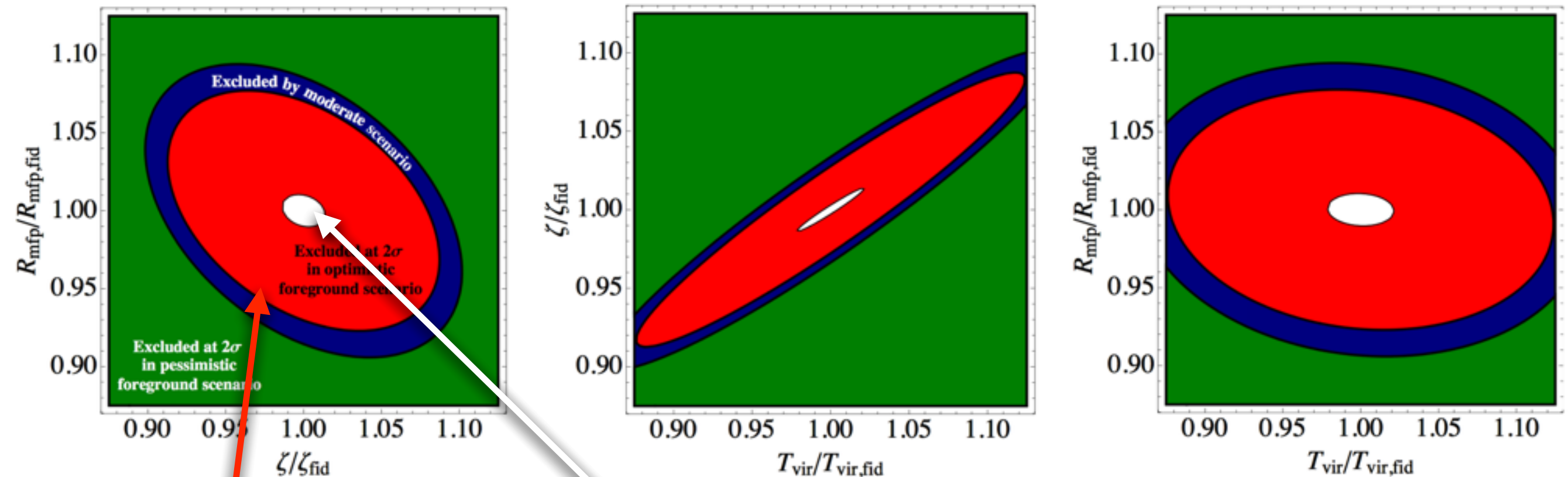


...and break degeneracies using information from multiple redshifts.





We can expect to constrain reionization astrophysics parameters with  $\sim 5\text{-}10\%$  precision.

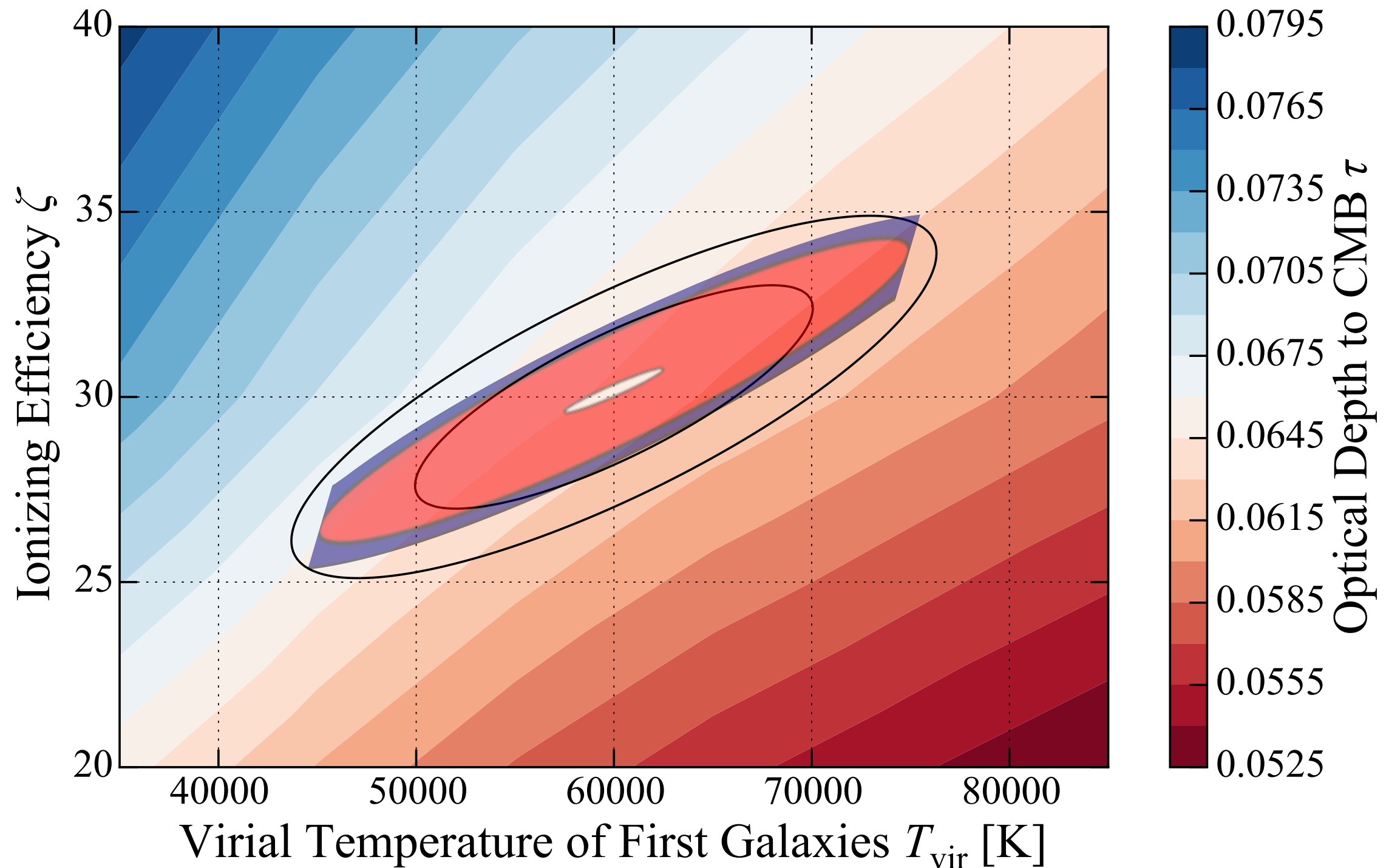


Working inside  
the EoR window.

Working inside  
the wedge too.

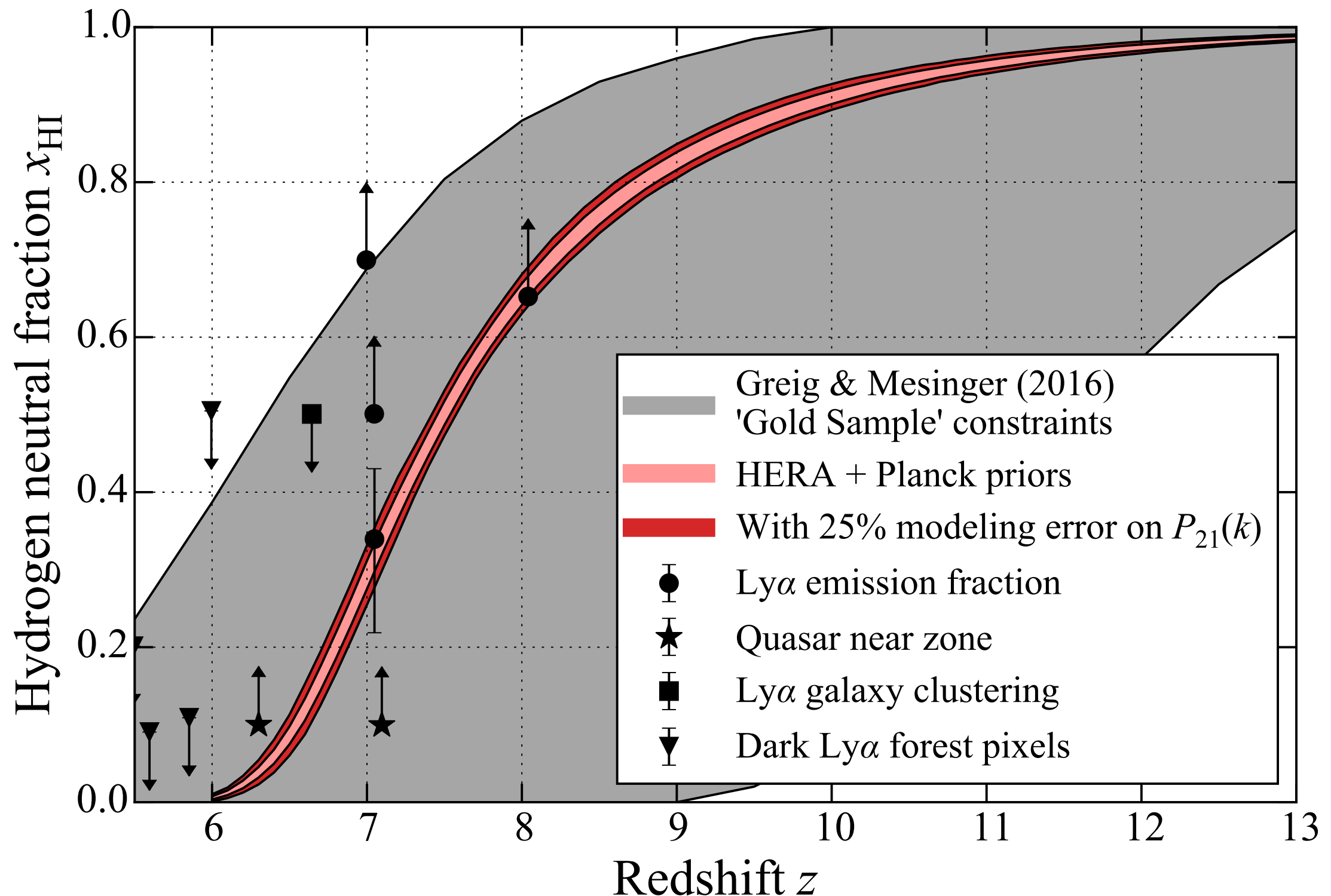
*(These are parameters still  
unconstrained by an order  
of magnitude or more.)*

The  $T_{\text{vir}}\text{-}\zeta$  degeneracy doesn't strongly affect our measurement reionization history constraints.

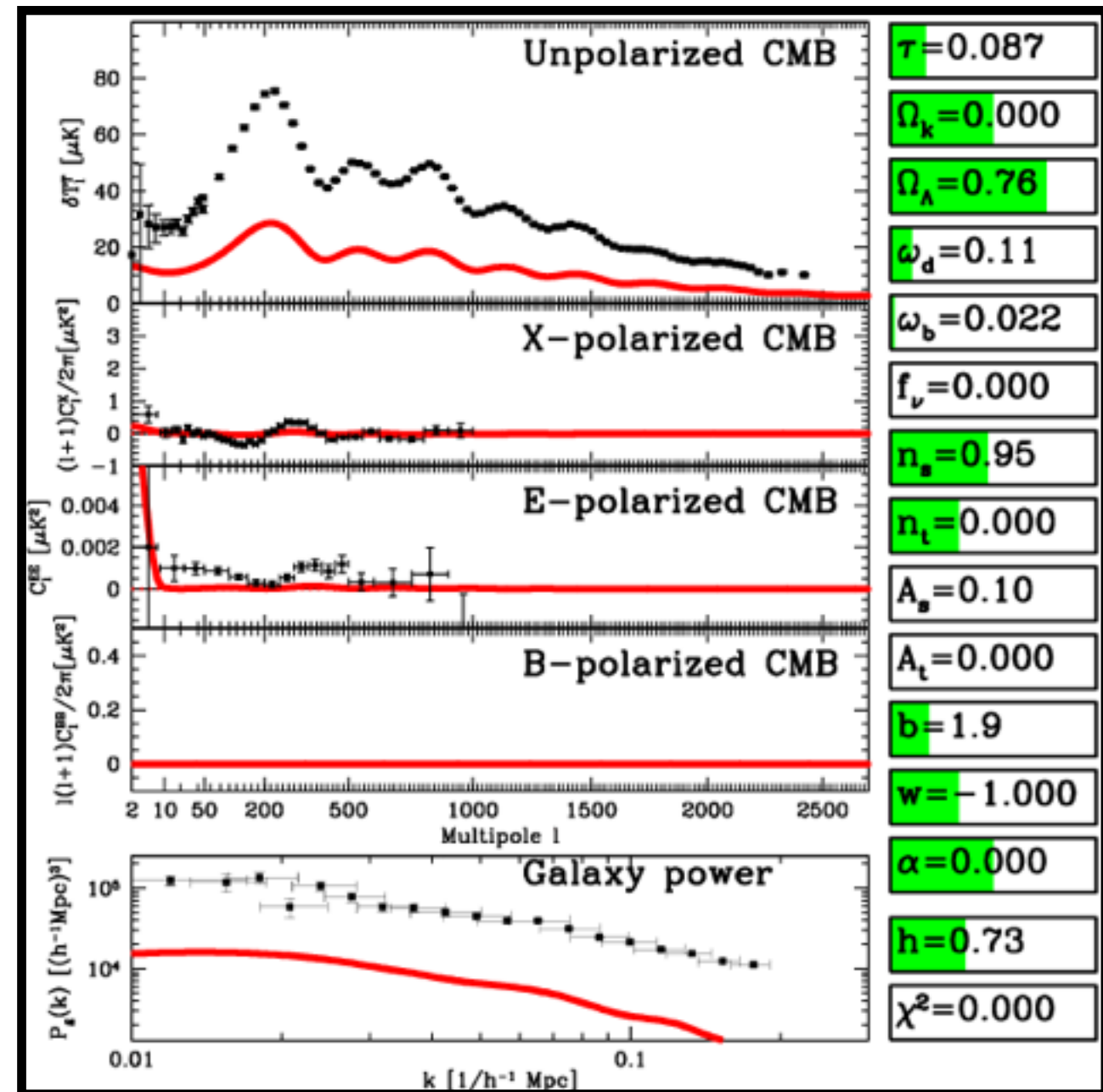
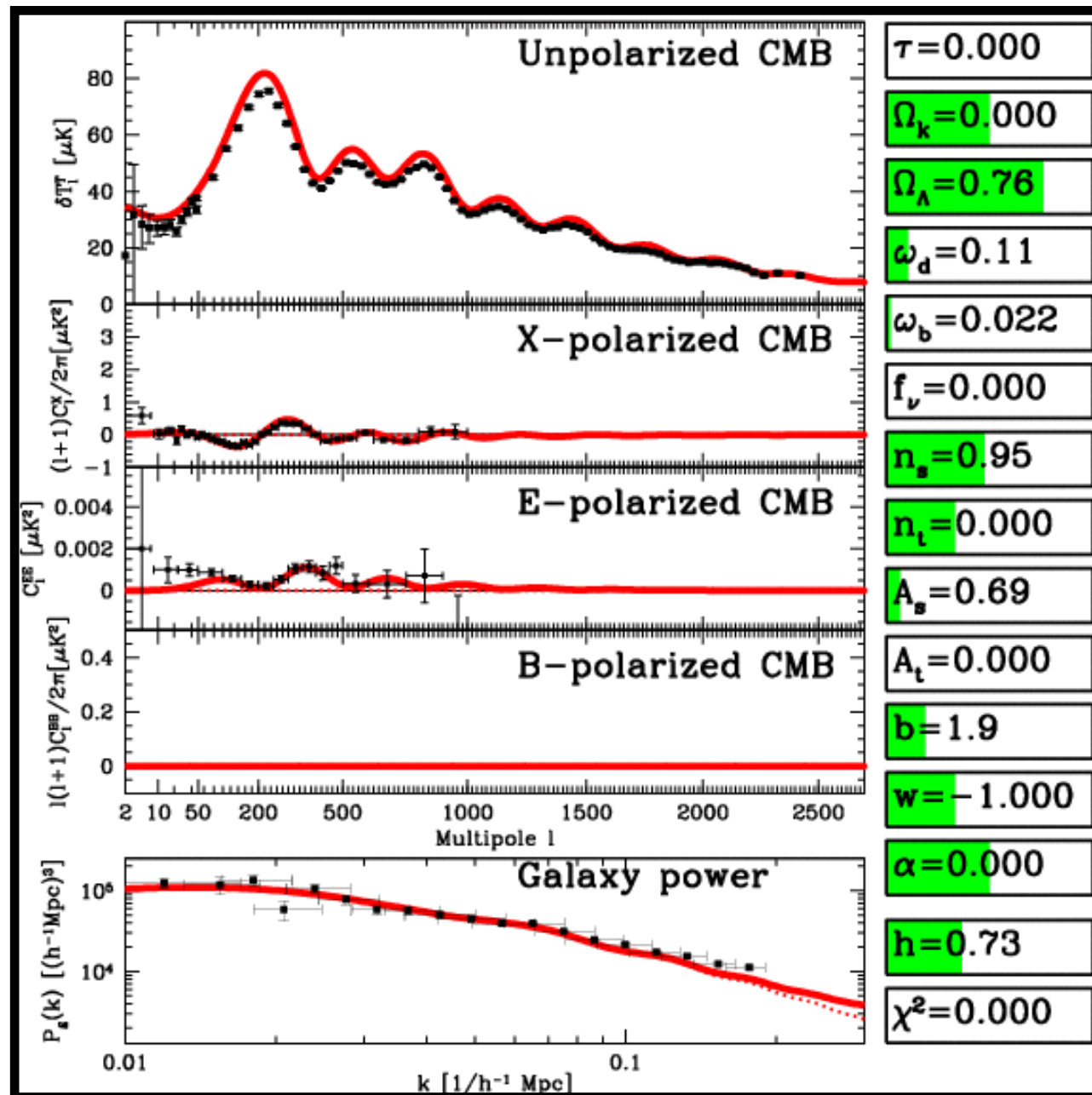




# So we can tightly constrain the ionization history of the universe.

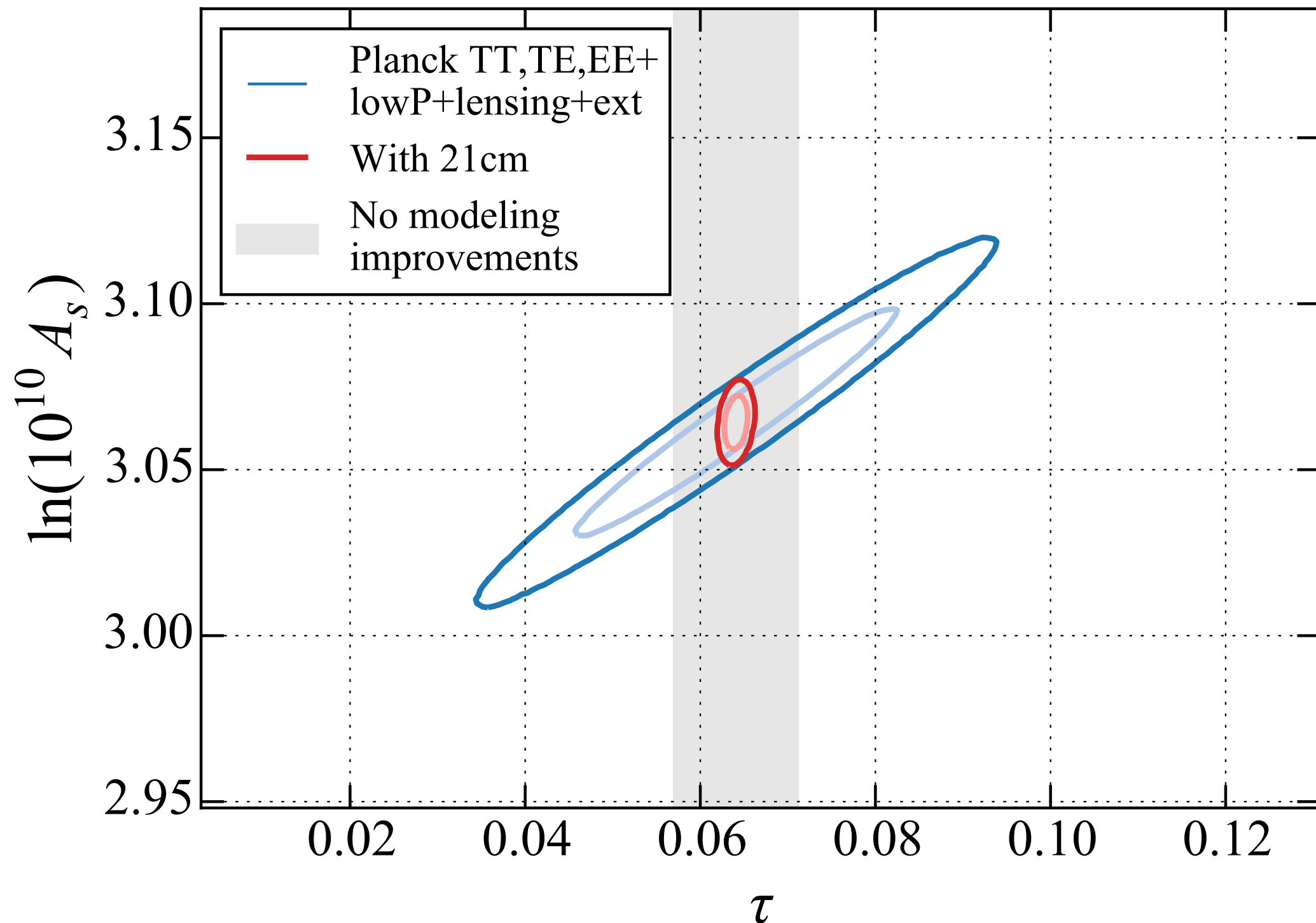


# And since $\tau$ is degenerate with $A_s$ ...

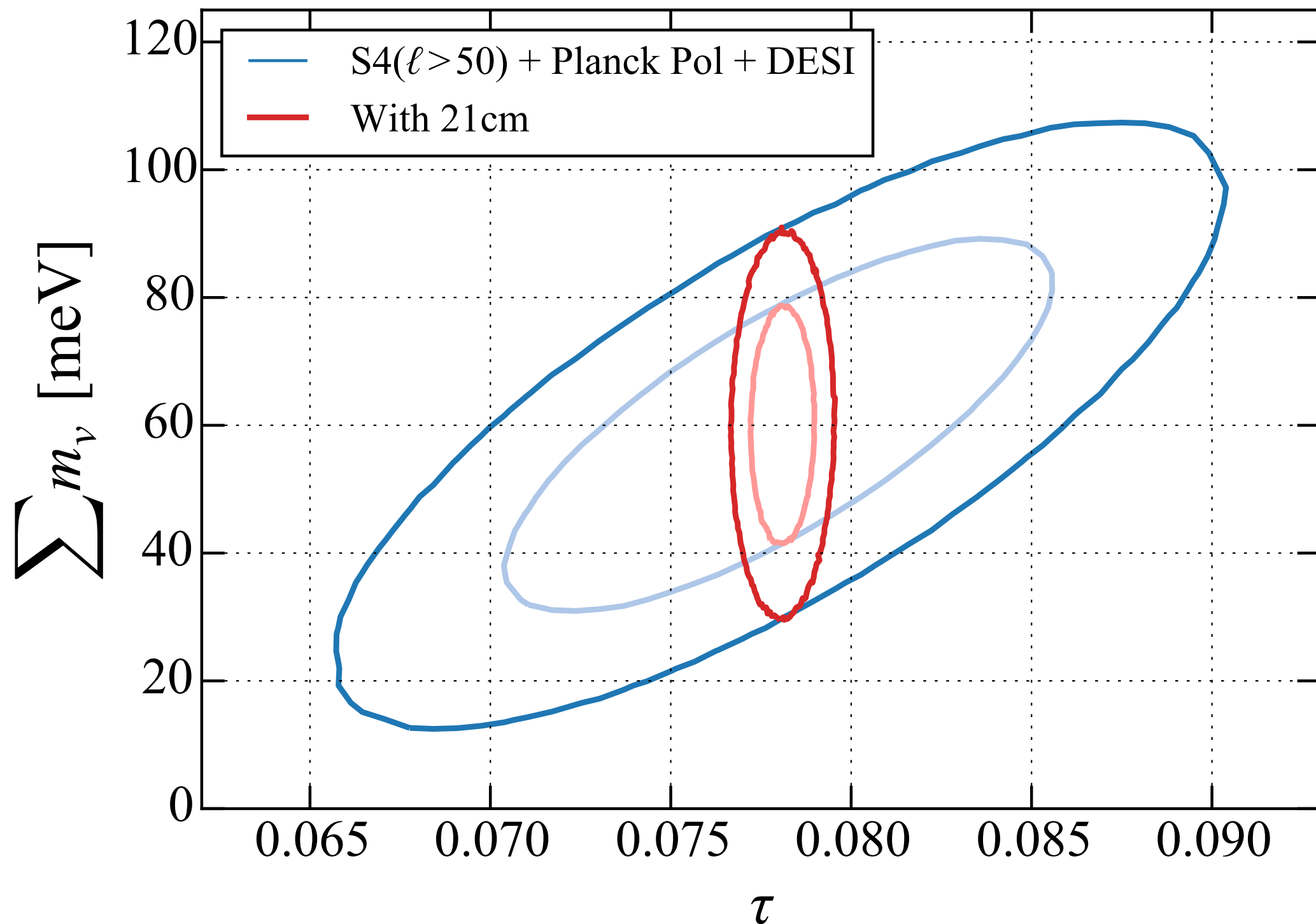




**We'll eliminate  $\tau$  as a CMB nuisance parameter, improving  $\sigma_8$  by a factor of 4.**



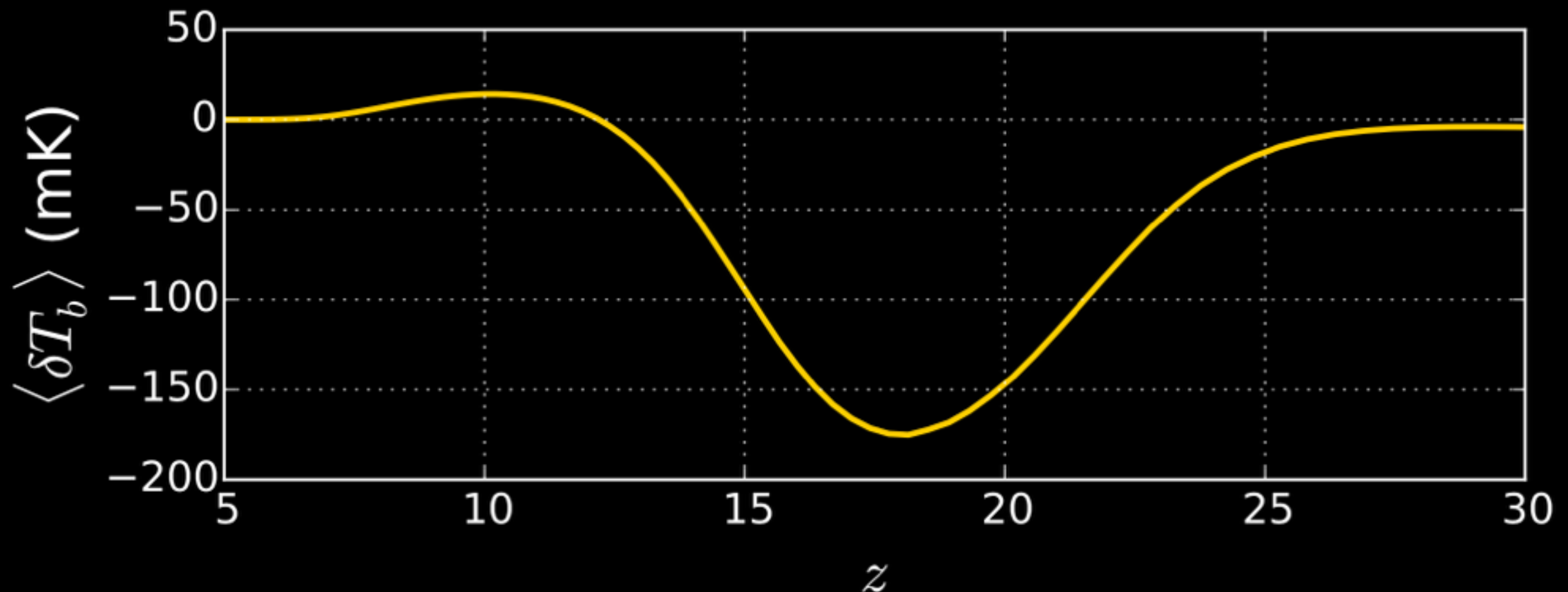
And, perhaps increase the significance of a detection of non-zero  $\Sigma m_\nu$  with CMB-S4.





Before reionization, X-ray heating of the IGM drove spin temperature fluctuations that dominated the 21 cm signal.

$$\delta T_b \propto x_{\text{HI}}(1 + \delta) \left[ 1 - \frac{T_{\text{CMB}}}{T_s} \right]$$



If the spin temperature doesn't saturate, we need a joint model for X-ray heating and reionization.

$$\delta T_b \propto x_{\text{HI}}(1 + \delta) \left[ 1 - \frac{T_{\text{CMB}}}{T_s} \right]$$

$$[\text{X-ray Emissivity}] \propto \alpha_X f_X \left( \frac{\nu}{\nu_{\text{min}}} \right)^{-\alpha_X} \rho_{\text{SFR}}$$

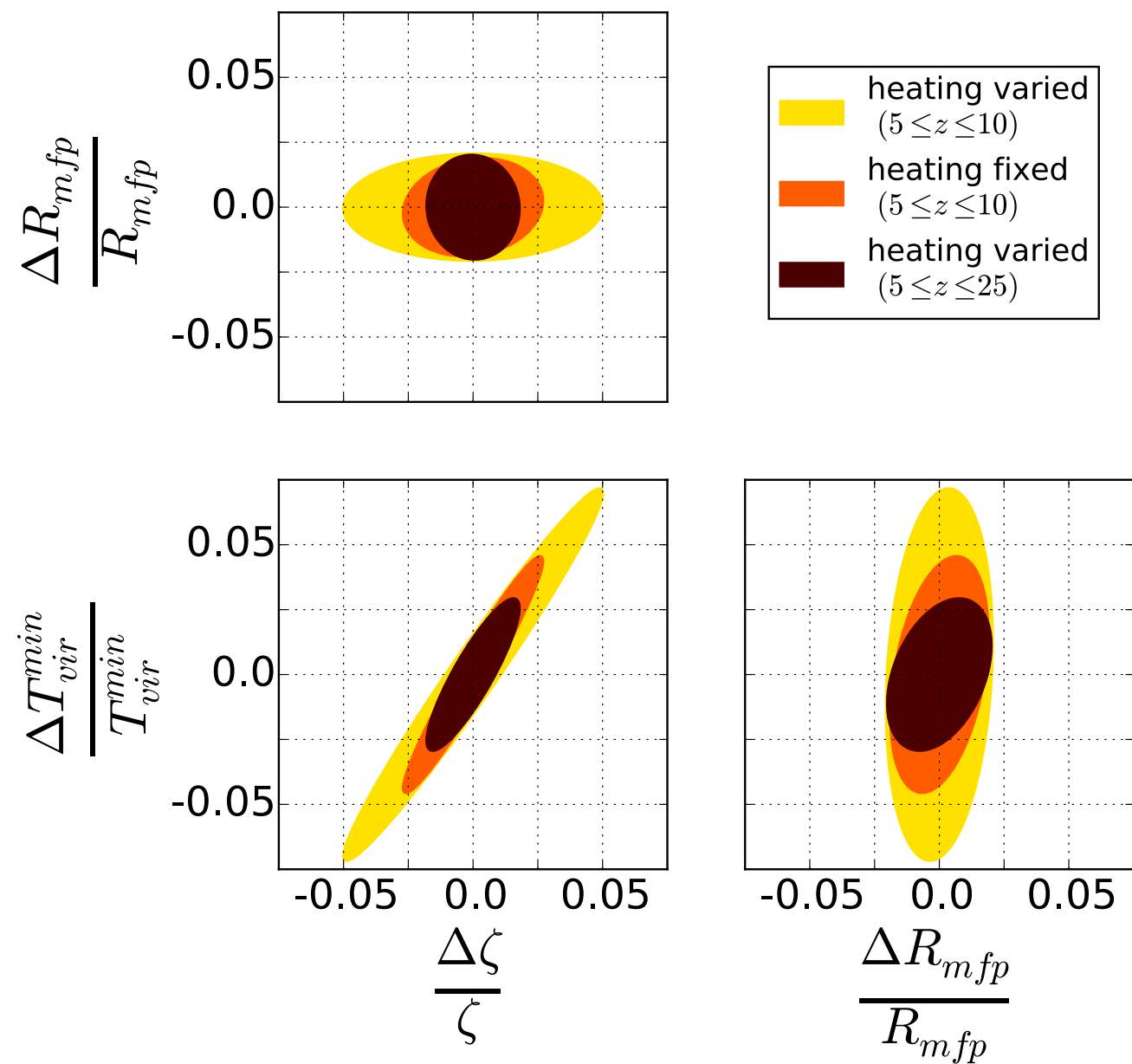
X-ray Efficiency  
(related to photons  
per star-forming  
baryon)

X-ray maximum  
energy cutoff

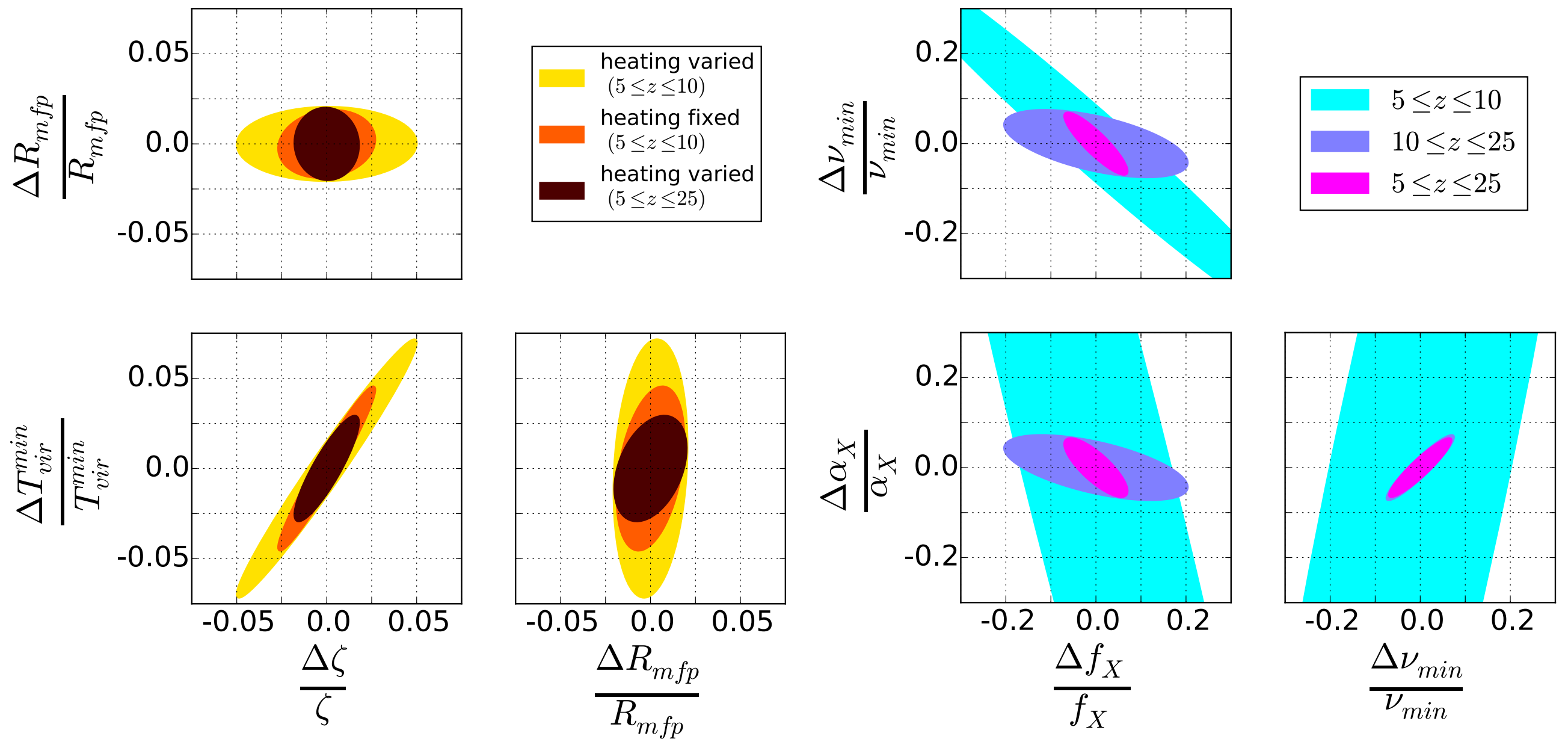
X-ray spectral  
hardness



We do better on reionization parameters  
if we can measure X-ray heating parameters at high  $z$ .



We do better on X-ray heating parameters  
if we can measure reionization parameters at low  $z$ .





# In Summary

- 21 cm cosmology will open up a huge volume of the universe during the largely unexplored “Cosmic Dawn.”
- We’ve already made great progress avoiding foreground contamination with first generation arrays, setting upper limits with astrophysical implications
- HERA will draw on the lessons of MWA, PAPER, and MITEoR with vastly increased sensitivity to convincingly detect the EoR and tightly constrain the physics behind reionization and the Cosmic Dawn.



**Backup Slides**



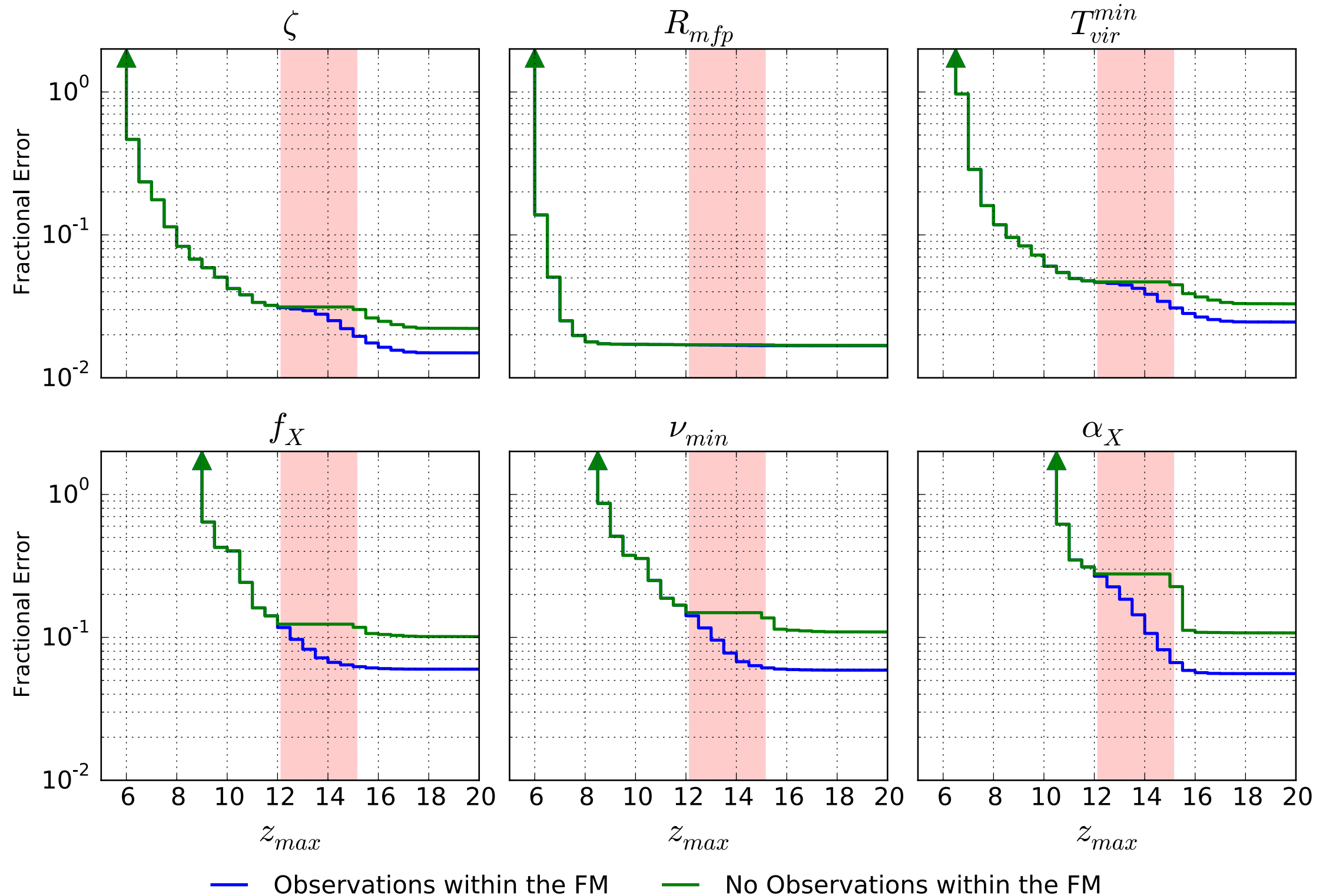
Table 1: Sensitivities (i.e. “number of sigmas”) of 21 cm EoR experiments to the reionization model used in Poher et al. (2014).

| Instrument            | Avoidance |       | Subtraction |       |
|-----------------------|-----------|-------|-------------|-------|
|                       | Drift     | Track | Drift       | Track |
| PAPER 128             | 0.77      | —     | 3.04        | —     |
| MWA 128               | 0.31      | 0.41  | 1.63        | 2.08  |
| LOFAR                 | 0.38      | 1.06  | 5.36        | 9.21  |
| HERA 37               | 2.75      | —     | 11.73       | —     |
| HERA 331              | 25.53     | —     | 90.76       | —     |
| MWA 256 <sup>a</sup>  | 1.02      | 1.24  | 5.54        | 6.51  |
| SKA1 Low <sup>b</sup> | 13.44     | 19.55 | 109.90      | 98.15 |

<sup>a</sup> The “Beardsley” proposed array. The final layout will likely move more antennas from the core to longer distances, reducing the EoR sensitivity of the instrument.

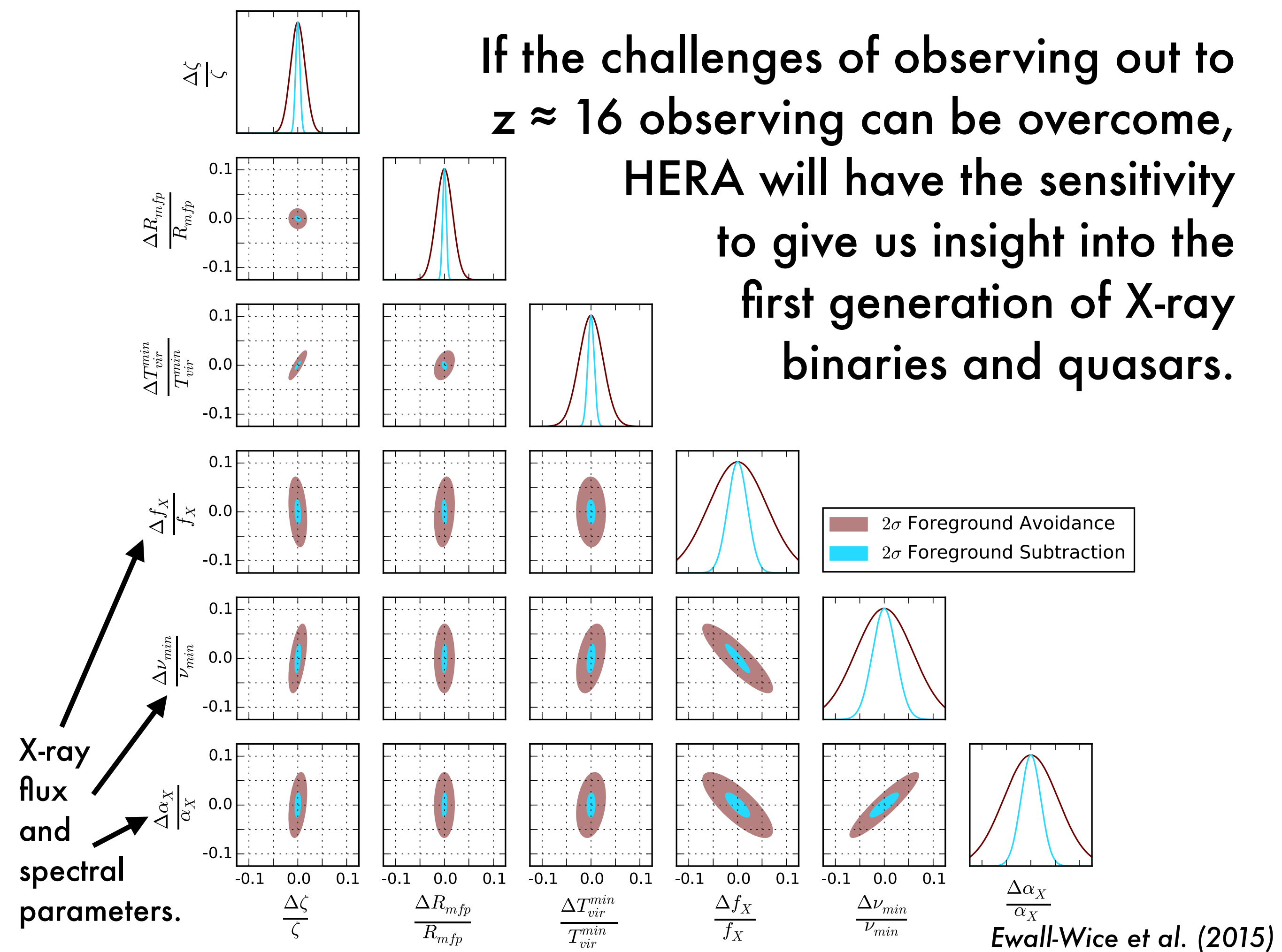
<sup>b</sup> Re-baselined design includes half the number of elements. Note that halving the number of stations removes the need for a redundant core, i.e., the desired SKA element density profile now can be achieved at all radii.

# High- $z$ observations have a lot to tell us about both the reionization and the X-ray heating epoch.



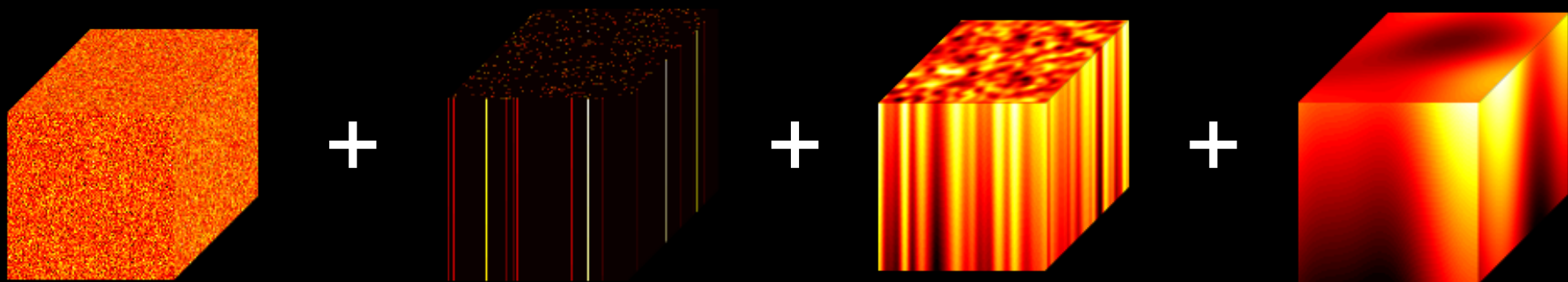


If the challenges of observing out to  $z \approx 16$  can be overcome, HERA will have the sensitivity to give us insight into the first generation of X-ray binaries and quasars.



# Fast Power Spectrum Estimation

1. Generate lots of random data cubes from the model covariance, exploiting symmetries



All in  $O(N \log N)^*$

*Dillon, Liu, &  
Tegmark (2013)*



# Fast Power Spectrum Estimation

1. Generate lots of random data cubes from the model covariance, exploiting symmetries

2. Calculate our quadratic estimator

$$q^\alpha \equiv \mathbf{x}^\top \mathbf{C}^{-1} \mathbf{Q}^\alpha \mathbf{C}^{-1} \mathbf{x}$$

All in  $O(N \log N)^*$

*Dillon, Liu, &  
Tegmark (2013)*

# Fast Power Spectrum Estimation

1. Generate lots of random data cubes from the model covariance, exploiting symmetries
2. Calculate our quadratic estimator

3. Monte Carlo many quadratic estimators to get error bars and window functions.

$$\text{Use } \text{Cov}(\mathbf{q}) = \mathbf{F}$$

$$\text{To avoid } F^{\alpha\beta} = \frac{1}{2} \text{tr} [\mathbf{C}^{-1} \mathbf{Q}^{\alpha} \mathbf{C}^{-1} \mathbf{Q}^{\beta}]$$

All in  $O(N \log N)^*$

*Dillon, Liu, &  
Tegmark (2013)*



# Our maps have different statistics than the true sky.

- We need to know  $\mathbf{P}$  to estimate power spectra and model foregrounds.
- Nominally,  $\mathbf{P}$  maps every point on the true sky to every point in the dirty map at every frequency and knows about every observation...so it's hard to calculate.

# Three ways to make it faster...

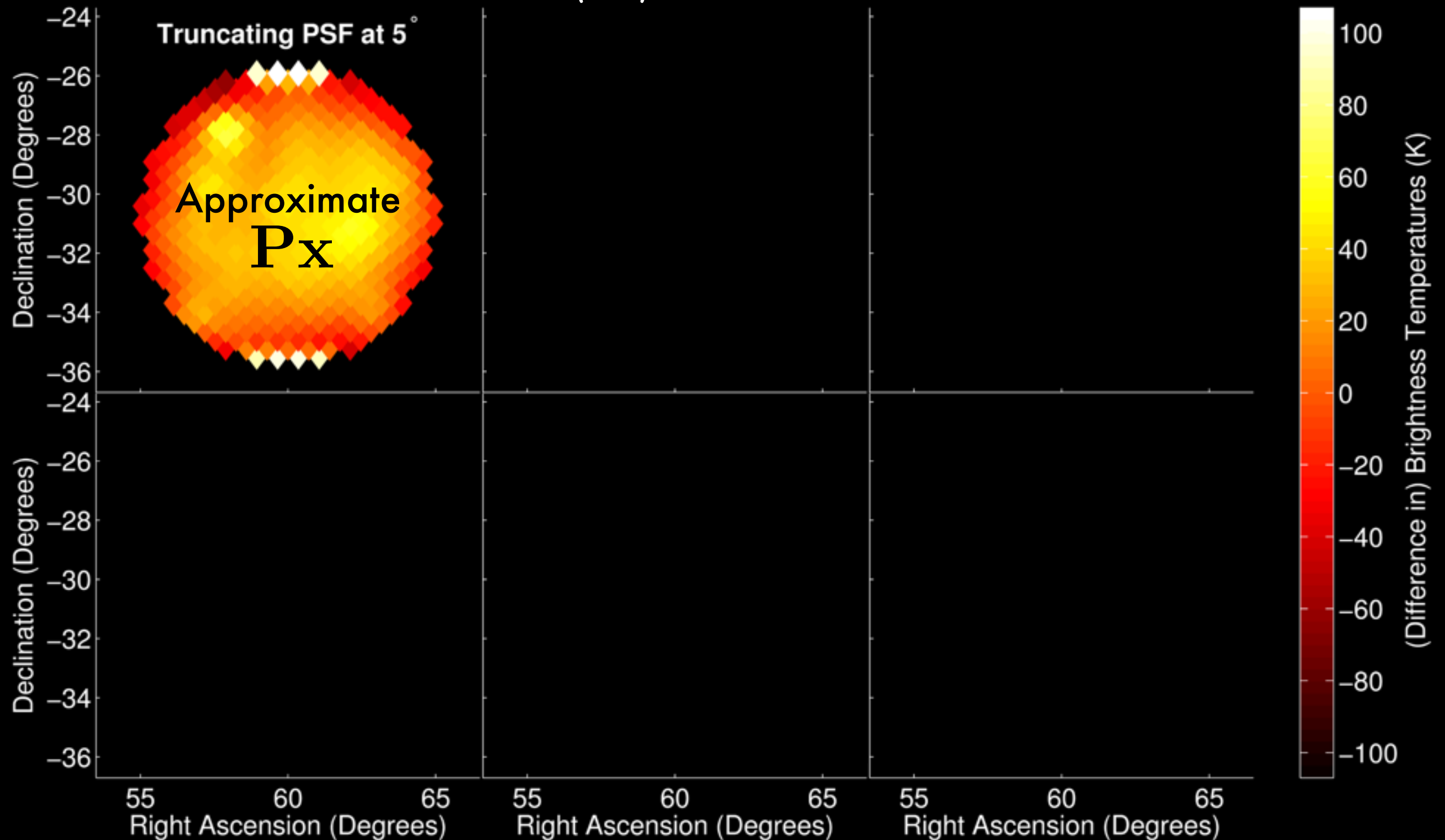
1. Truncating the PSF.
2. Combining together multiple sequential observations.
3. Fitting the PSF's translational variations with low-order polynomials.

All have speed vs. accuracy tradeoffs.

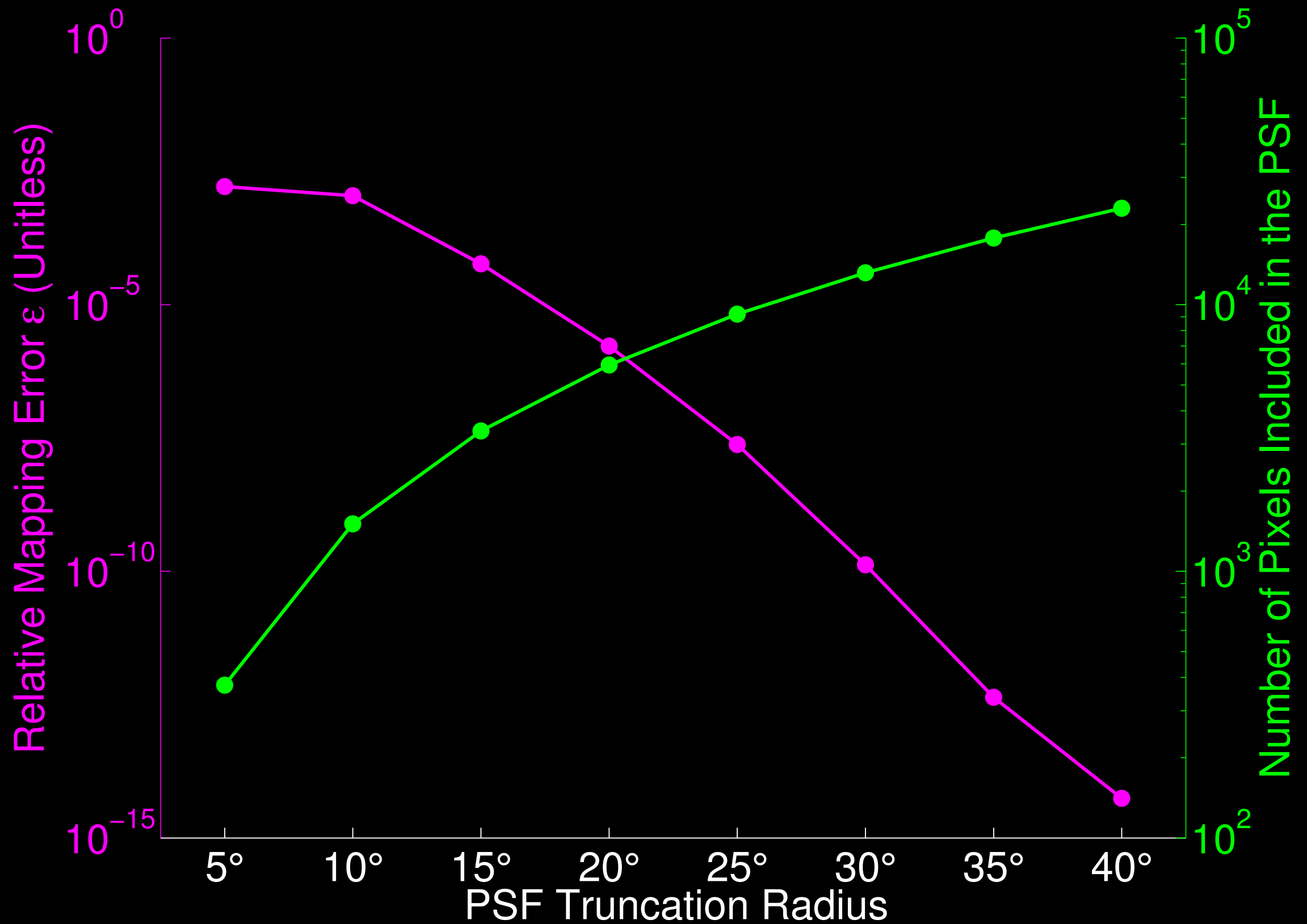


# Truncating the PSF trades speed for accuracy.

$$\langle \hat{\mathbf{x}} \rangle = \mathbf{P}\mathbf{x}$$



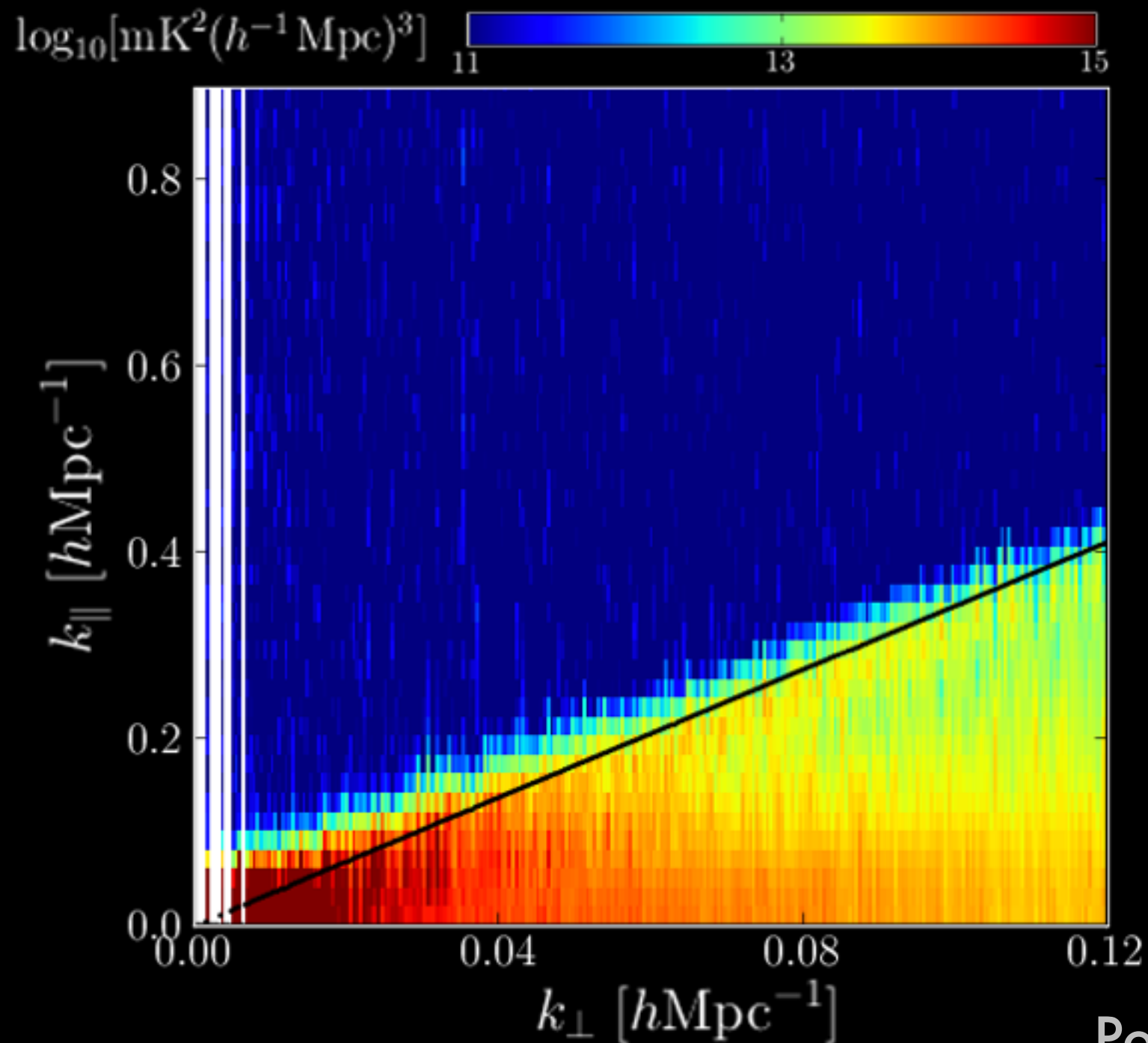
# Truncating the PSF trades speed for accuracy.



*Dillon et al. (2014b)*



The wedge has been observed to be,  
as far as we can tell, foreground free.



Pober et al. (2013)

See also Datta et al. (2010) and many others.

# We'll begin imaging the EoR directly.

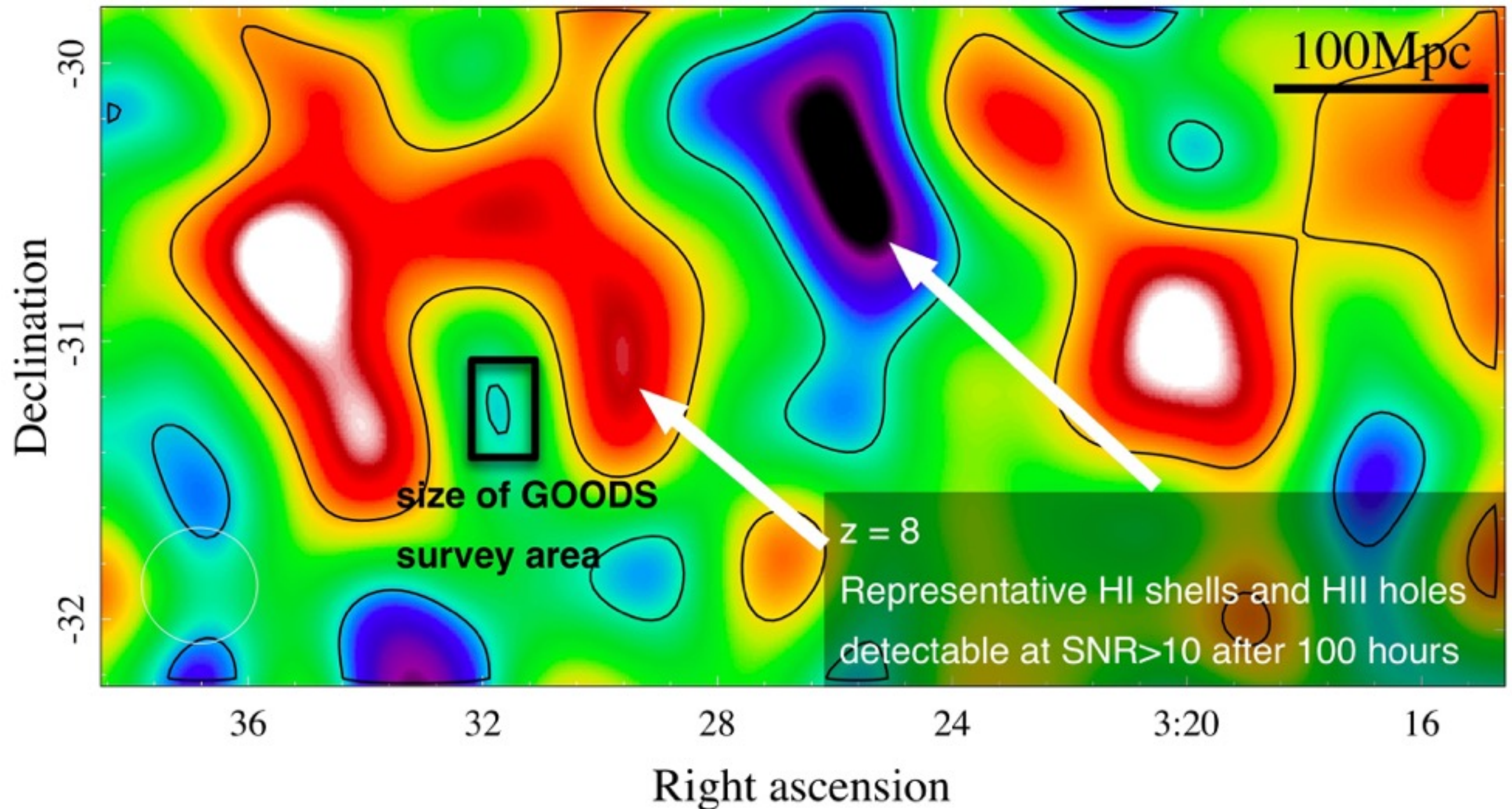
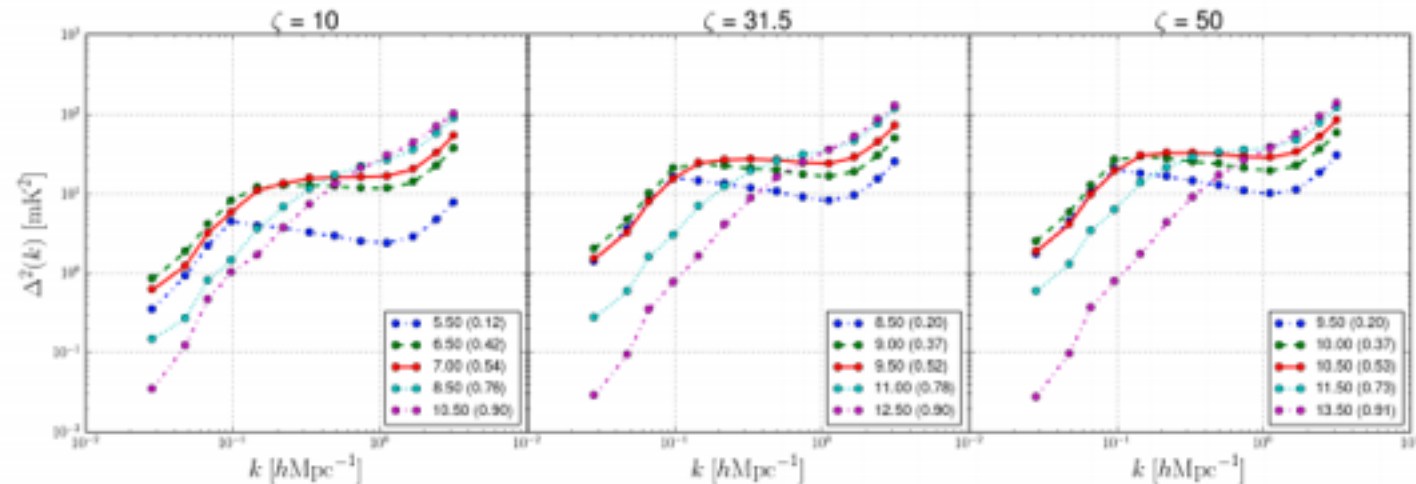


Figure: Danny Jacobs

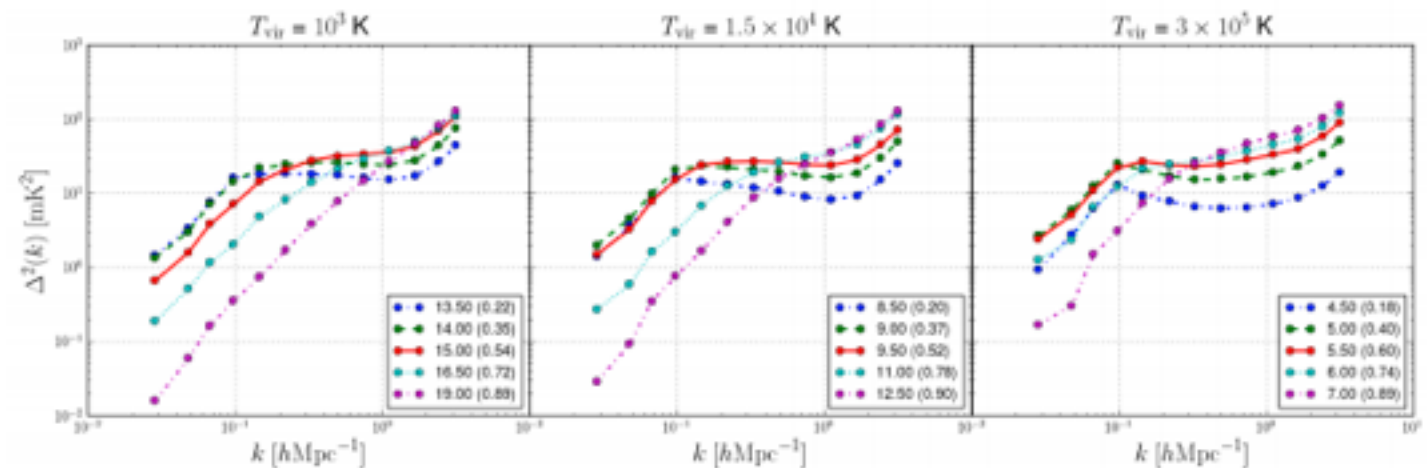


# Varying the reionization parameters yields qualitatively different power spectra.

Varying  $\zeta$ :



Varying  $T_{\text{vir}}$ :



Varying  $R_{\text{mfp}}$ :

