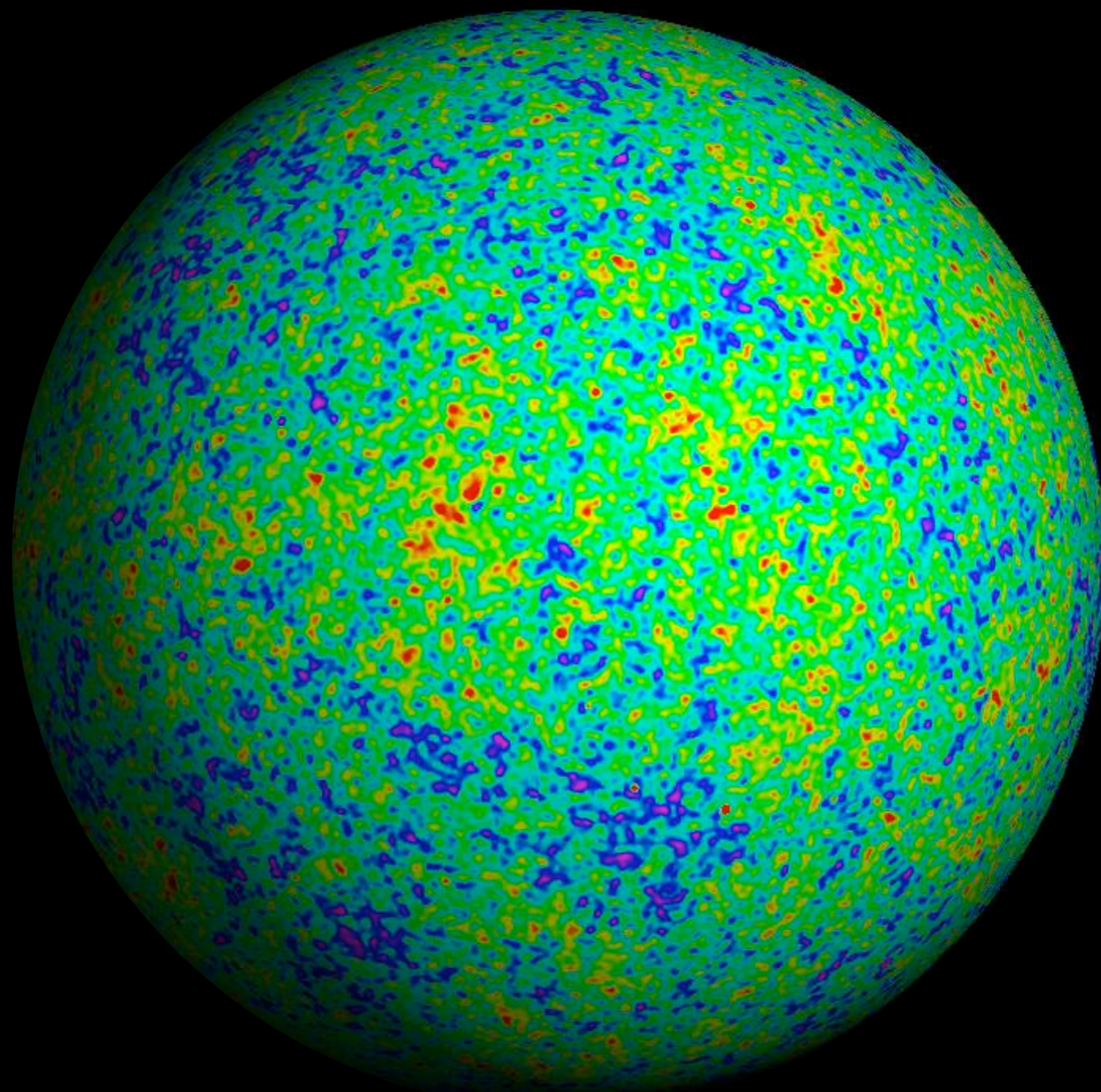


High-Redshift 21 cm Cosmology

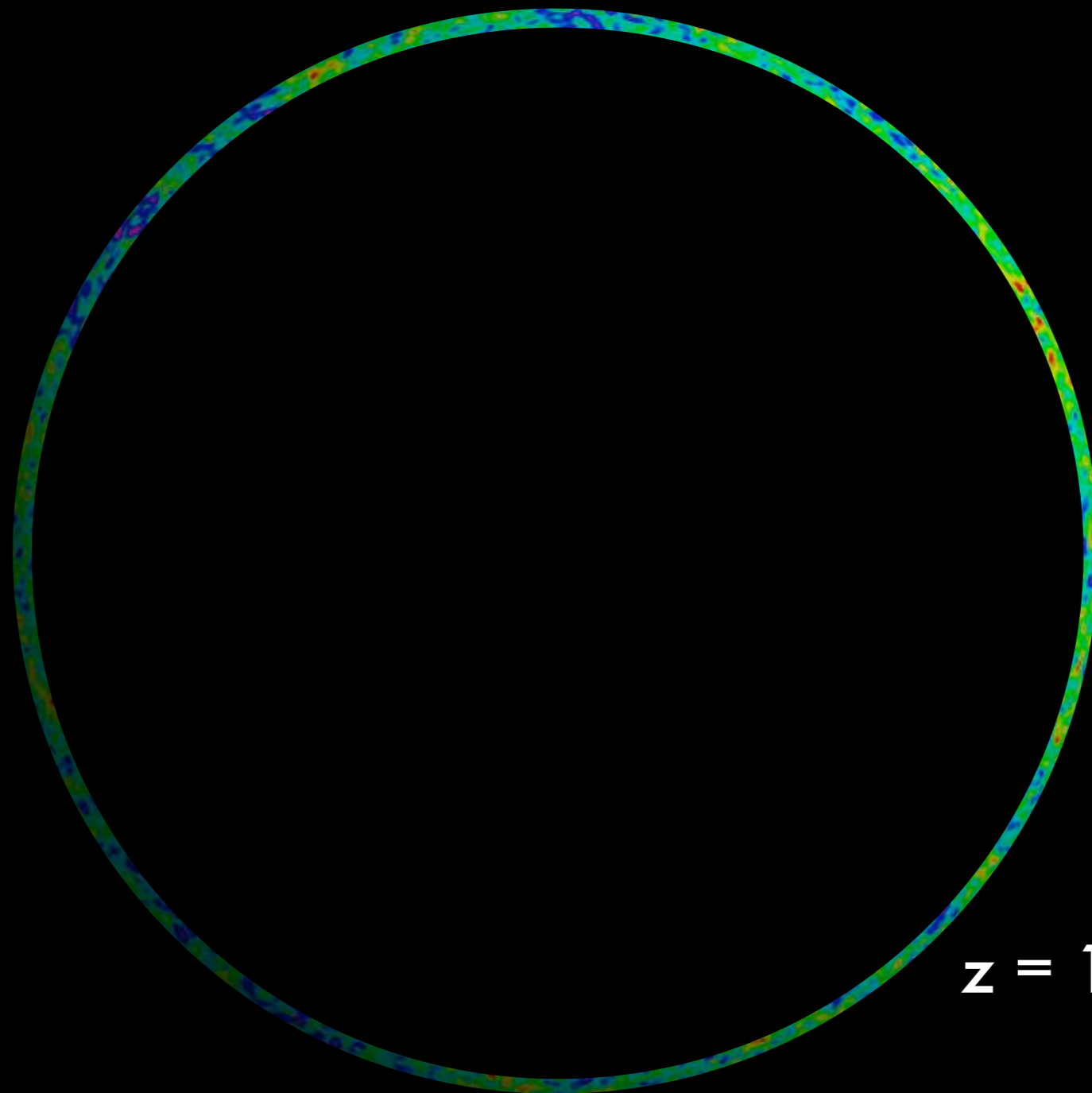
Josh Dillon
UC Berkeley

**How can we map out
our whole universe?**

With the CMB...

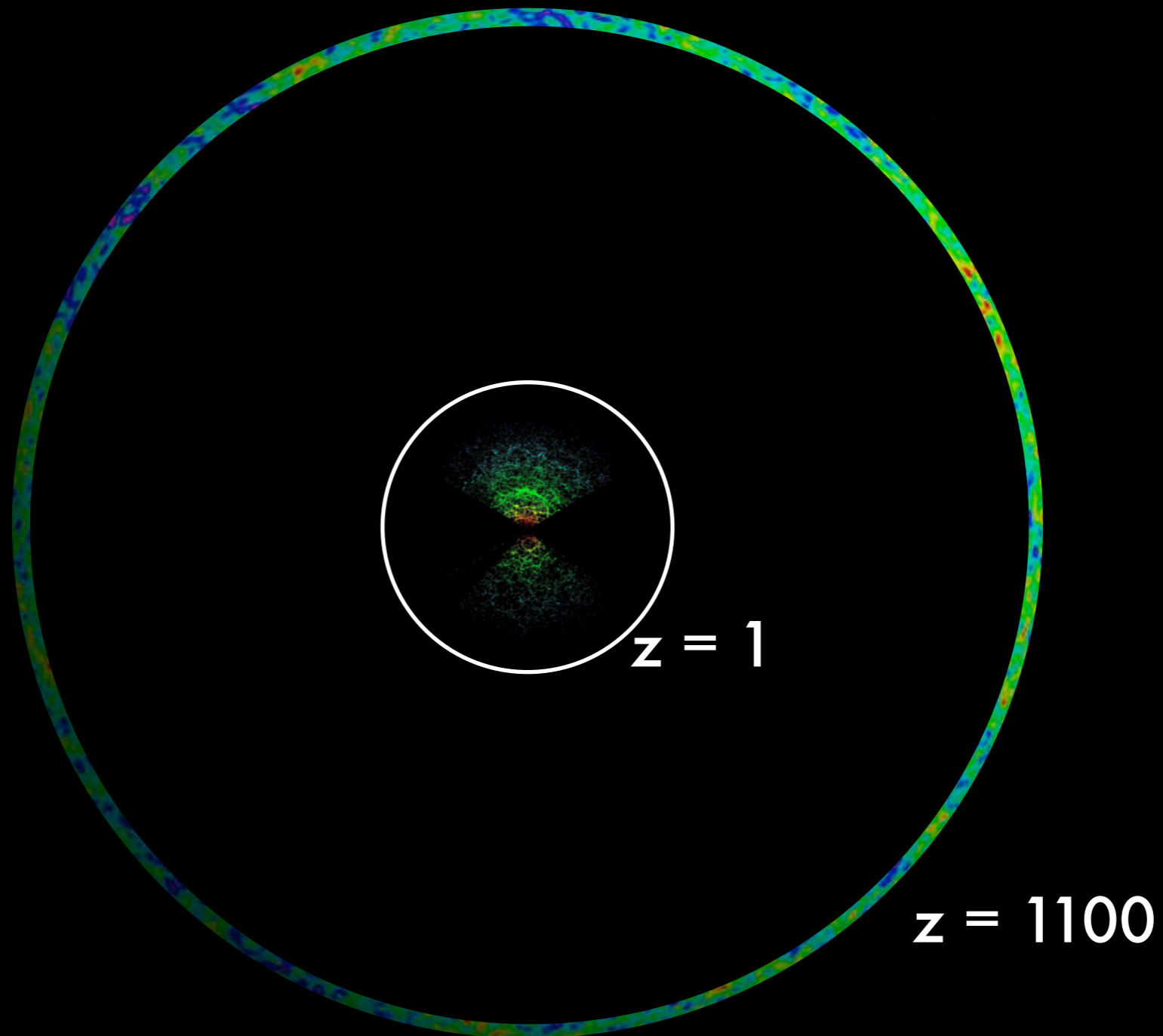


...we only get a thin shell at high redshift.

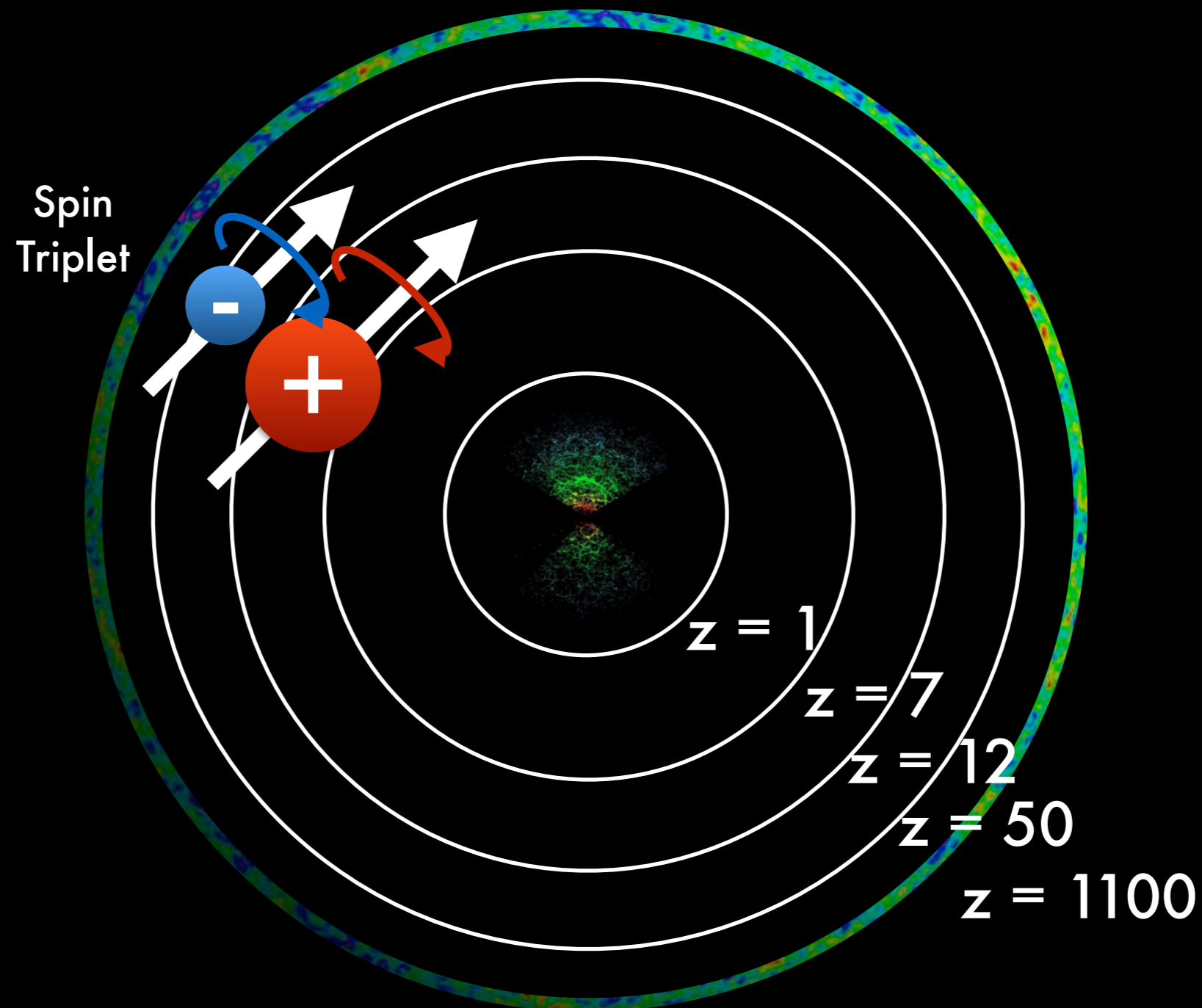


$z = 1100$

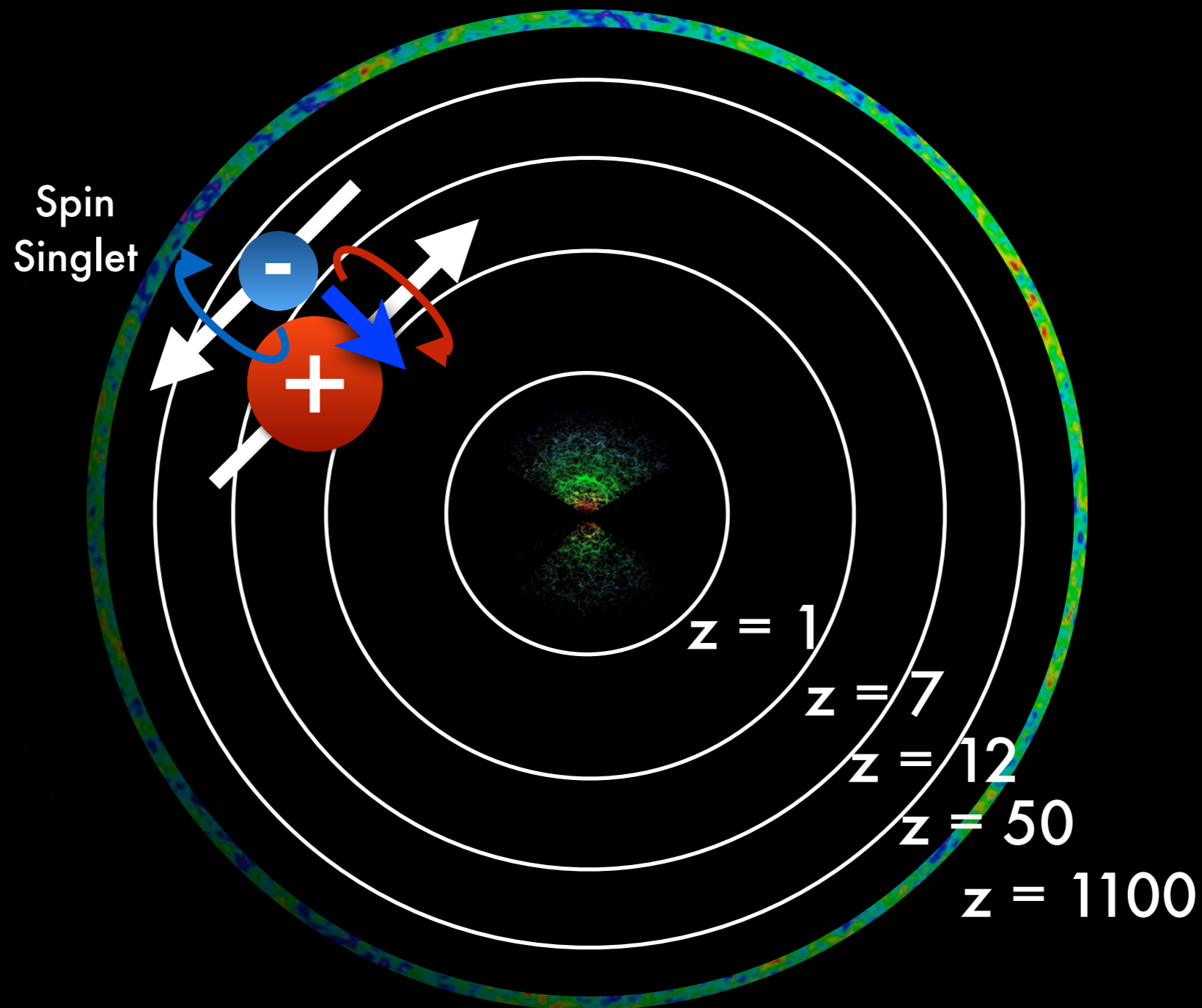
Galaxy surveys only tell us about the local universe.



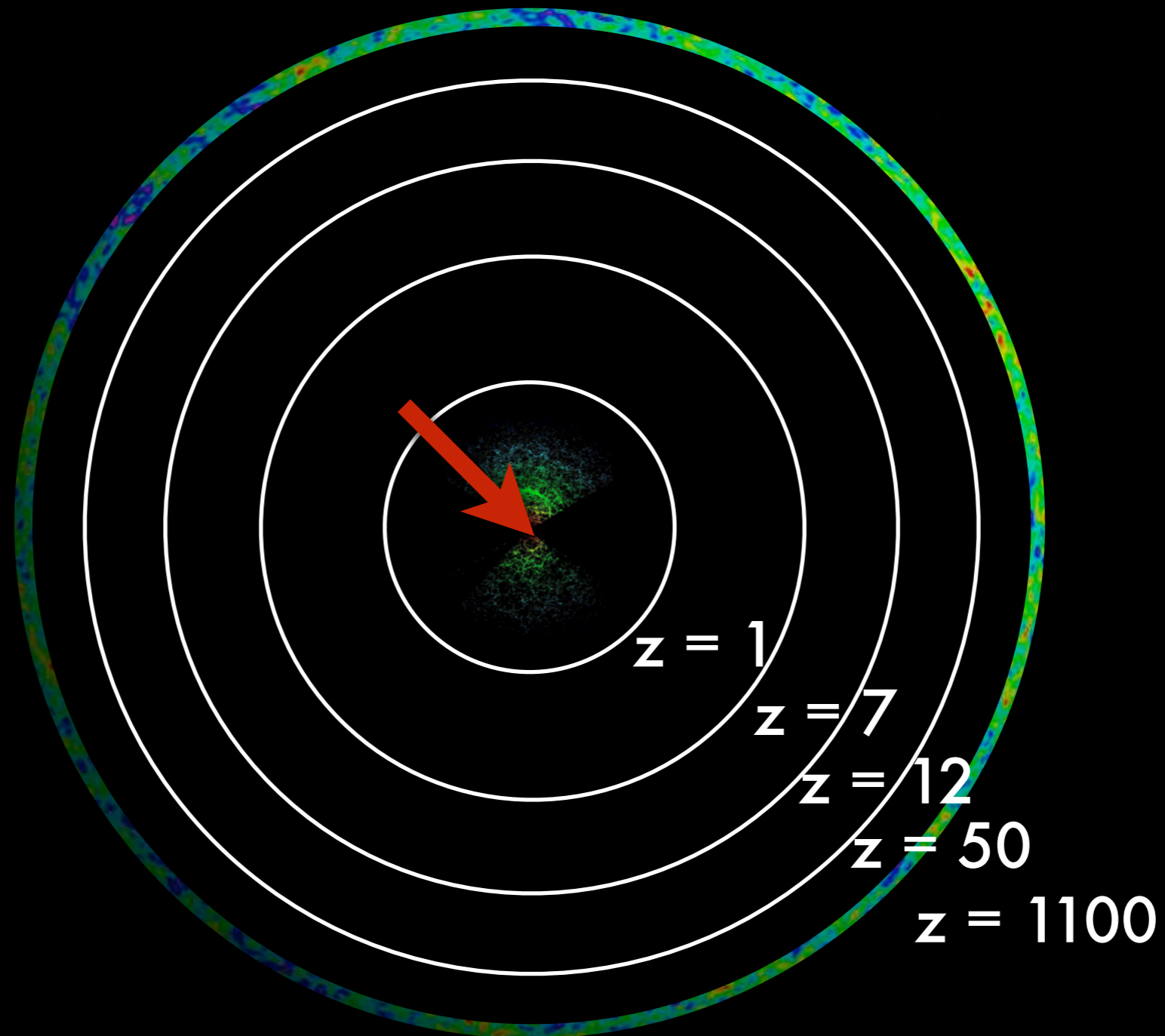
But using the 21 cm hydrogen line...



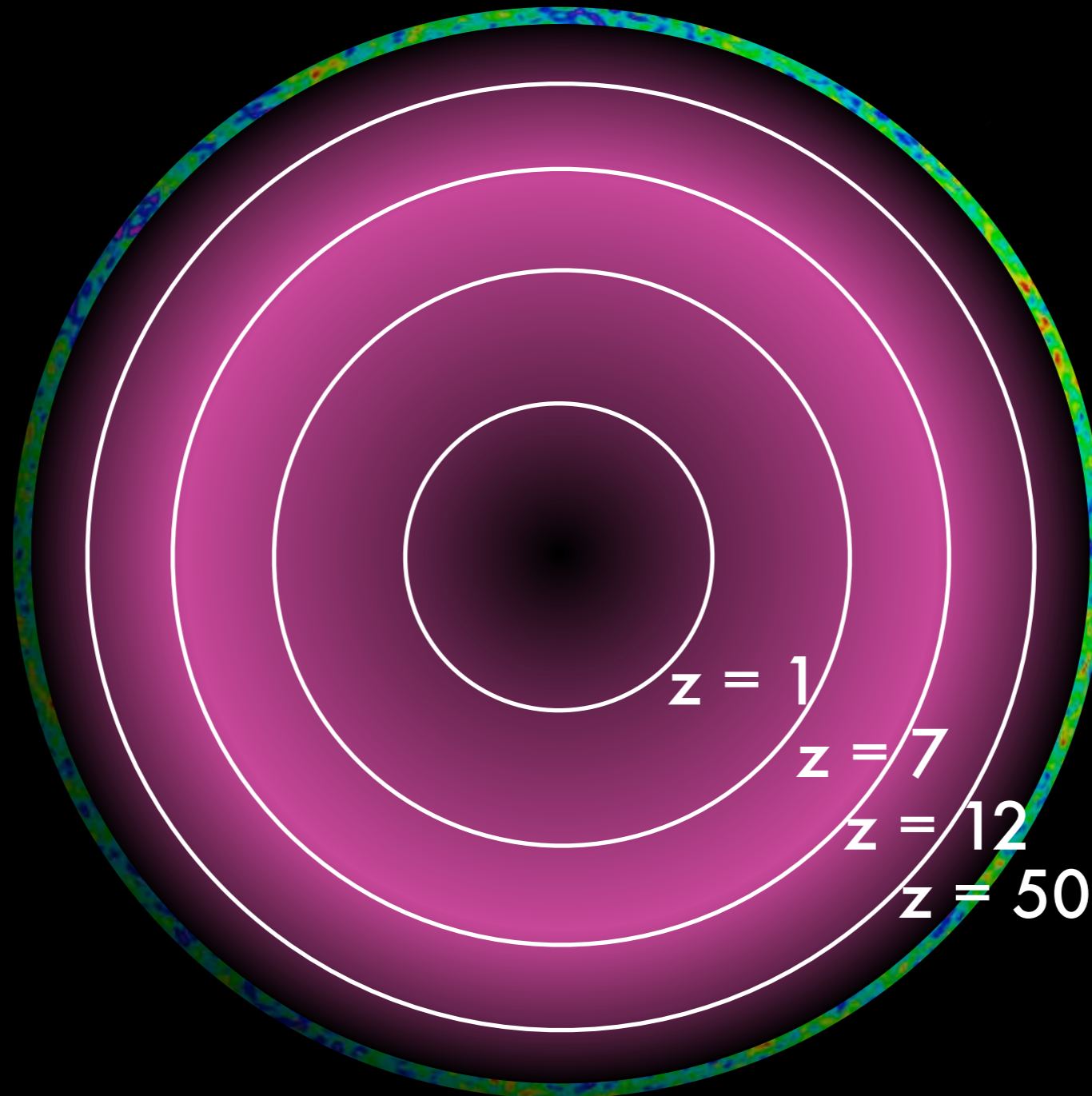
But using the 21 cm hydrogen line...



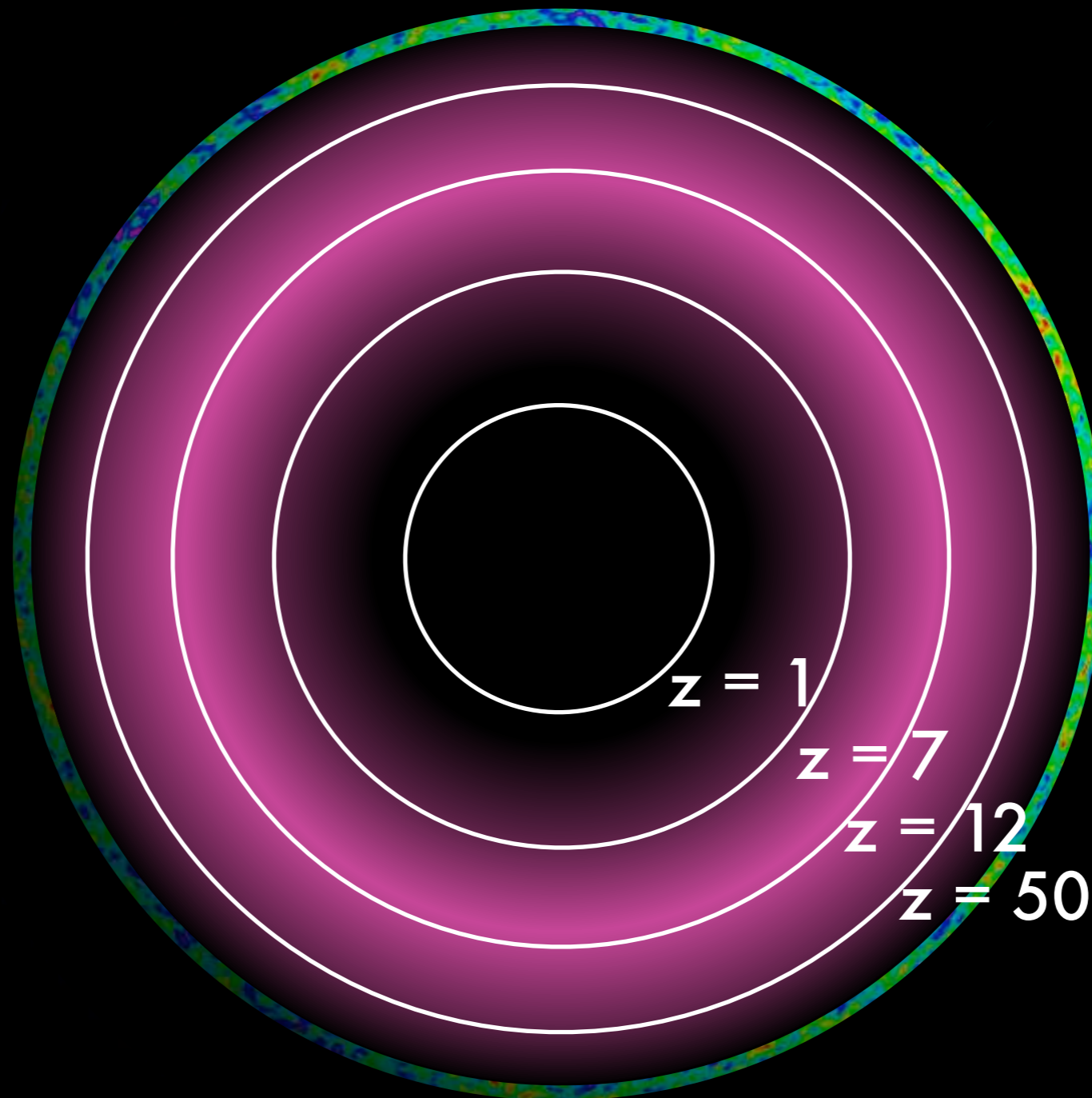
But using the 21 cm hydrogen line...



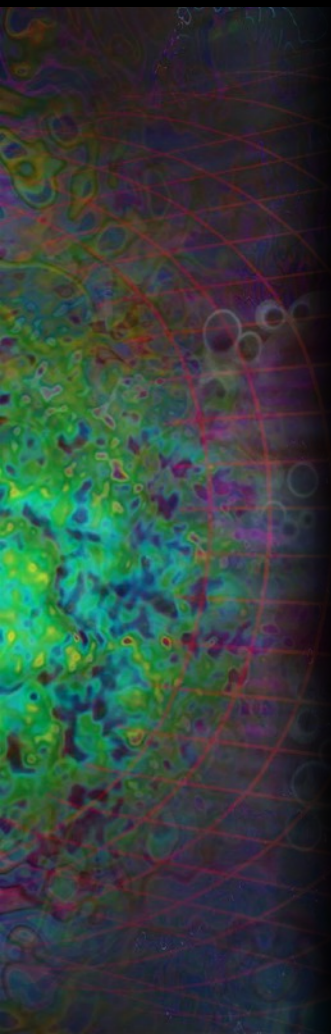
...a huge volume of the universe
can be directly probed ($z \lesssim 200$).



At $z \gtrsim 6$, we can map the universe as it undergoes a dramatic transformation.

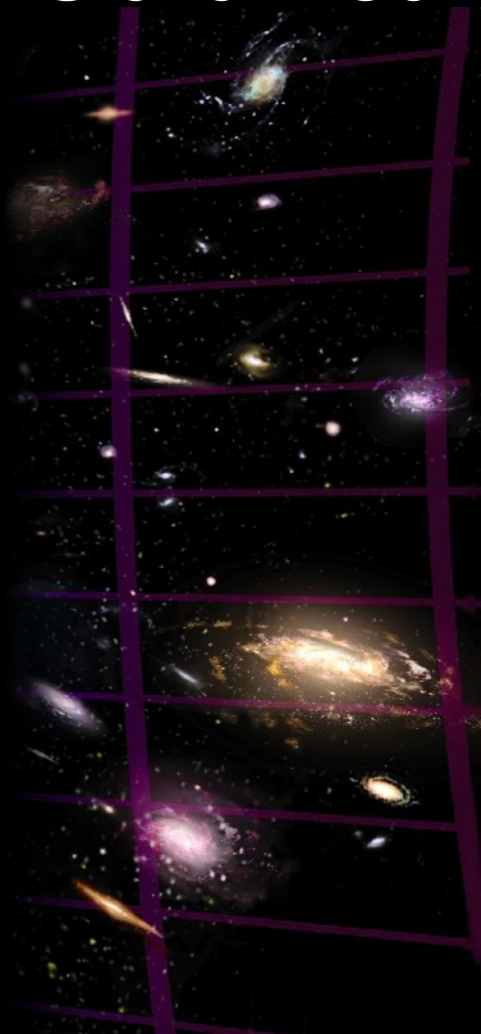


CMB



$z = 1100$

**Modern
Galaxies**



$z < 6$

CMB

Modern
Galaxies

Dark Ages

First Black Holes

First Stars


The Epoch of
Reionization

$z = 1100$

$z \approx 50$

$z \approx 8$

$z < 6$

The background of the slide is a complex, multi-layered image. On the left, there is a colorful, swirling pattern in shades of green, blue, and purple, resembling a nebula or a map of the cosmic microwave background. Overlaid on this is a grid of thin, glowing lines in various colors (green, blue, purple) that form a grid across the entire image. On the right side, there is a dark space filled with numerous galaxies of various shapes and colors, including spiral, elliptical, and irregular forms, some with bright cores. The overall effect is a rich, multi-colored cosmic scene.

First Black Holes

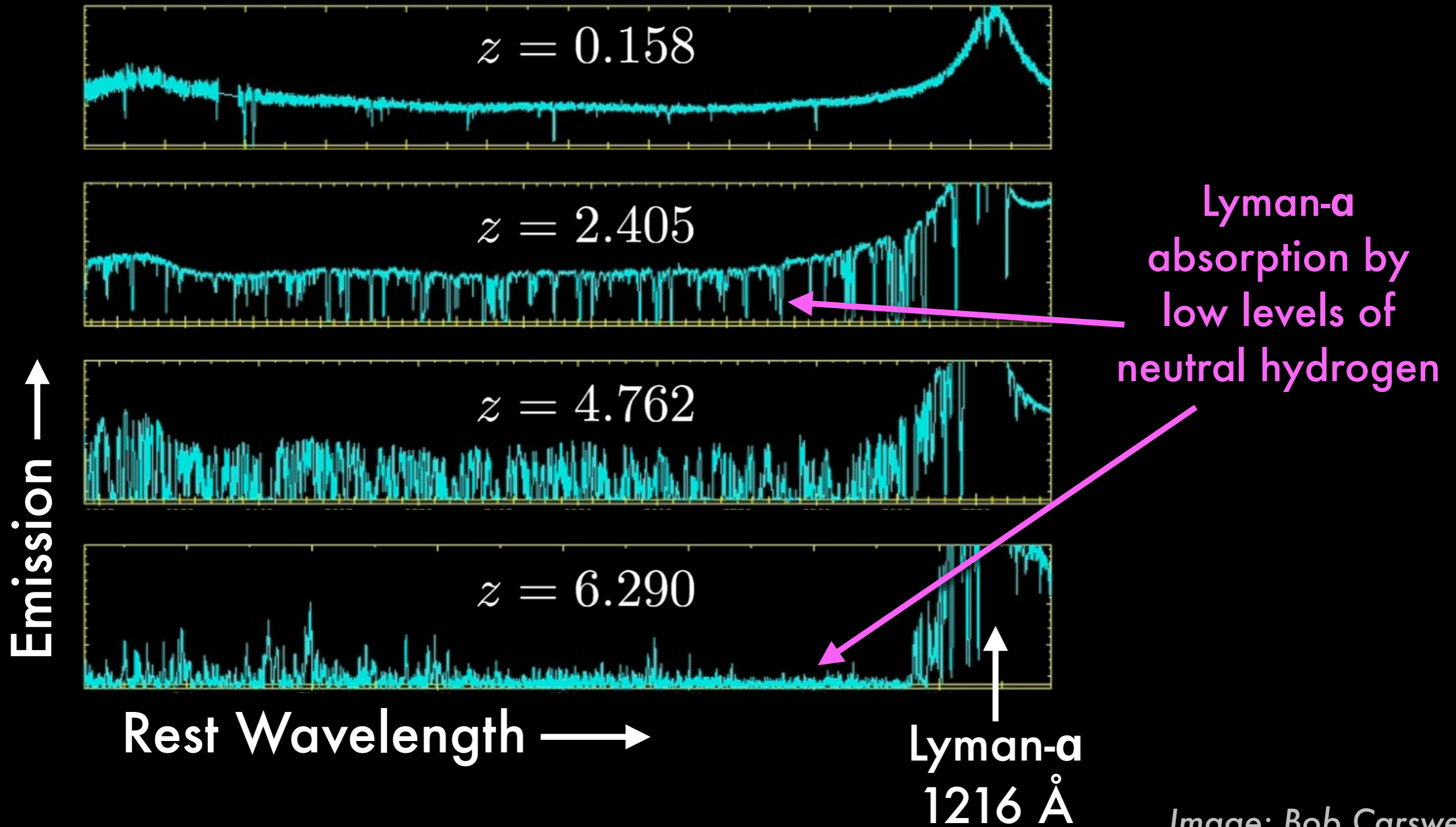
The Cosmic Dawn

First Stars

The Epoch of
Reionization

**We already have some
clues about reionization.**

Quasar Lyman- α spectra tell us that reionization ended around redshift 6.



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

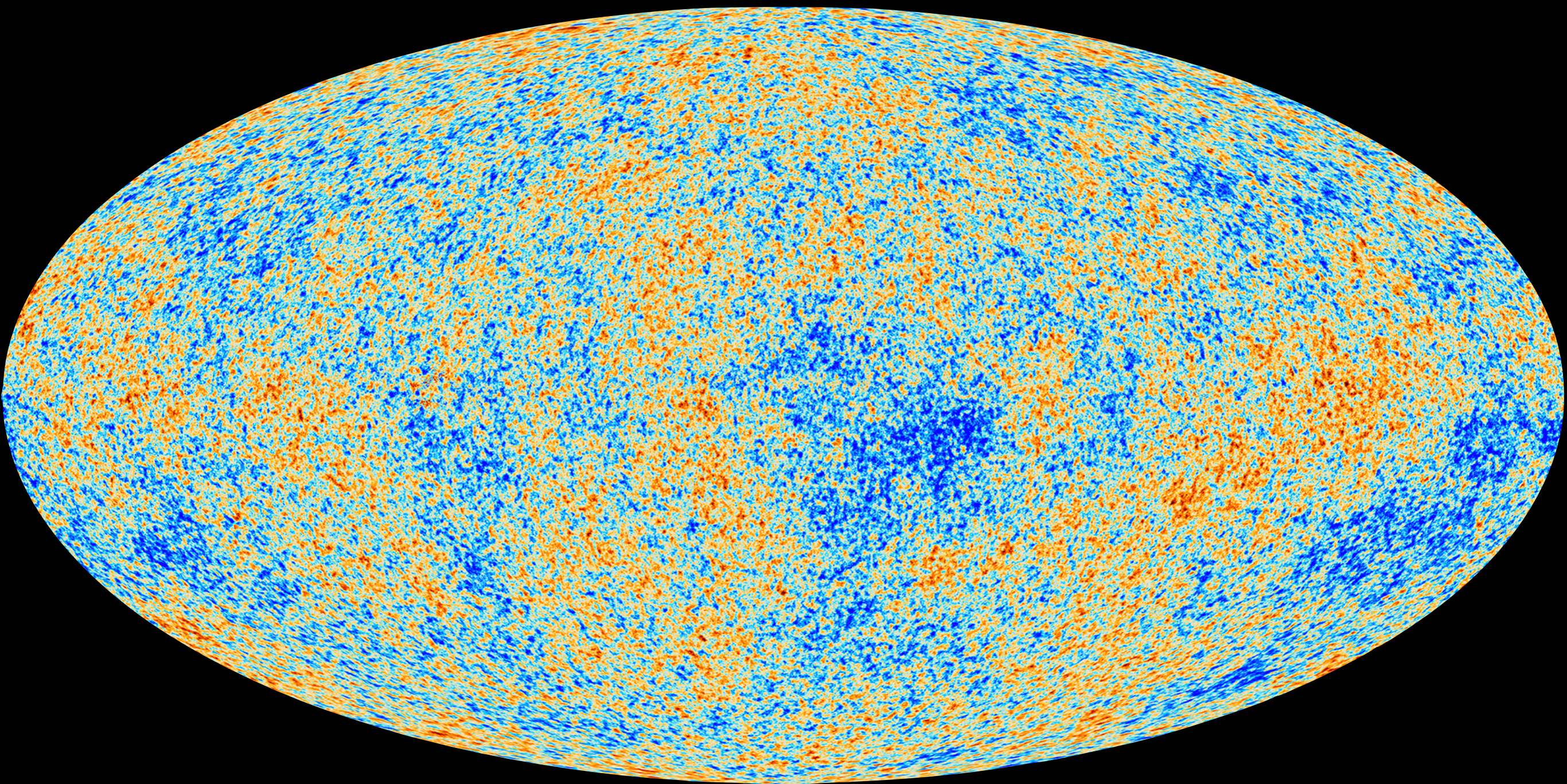
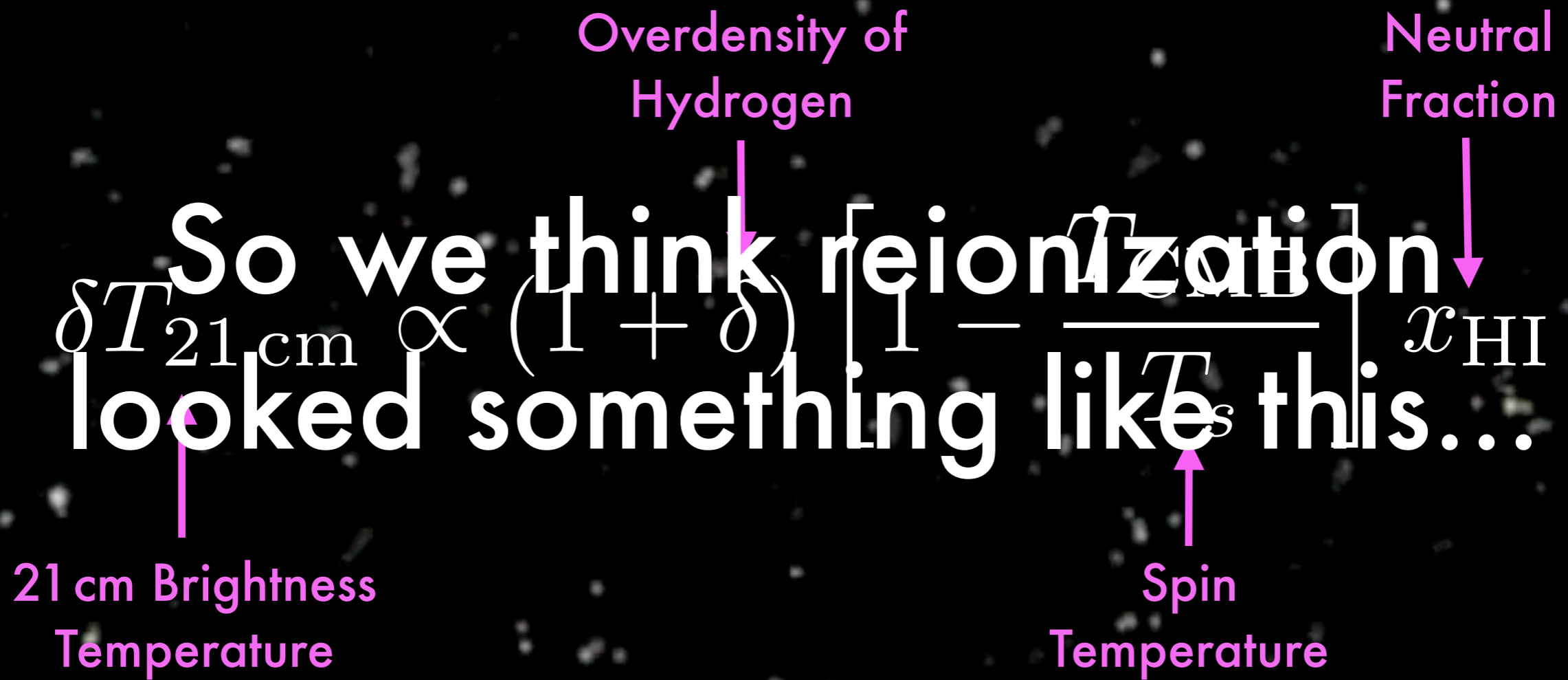


Image: Planck Collaboration

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

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

The Optical Depth
to Reionization



The brightness temperature probes different physics at different times.

Dark Ages

First Black Holes

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

First Stars

The Epoch of Reionization

$z = 1100$

$z \approx 50$

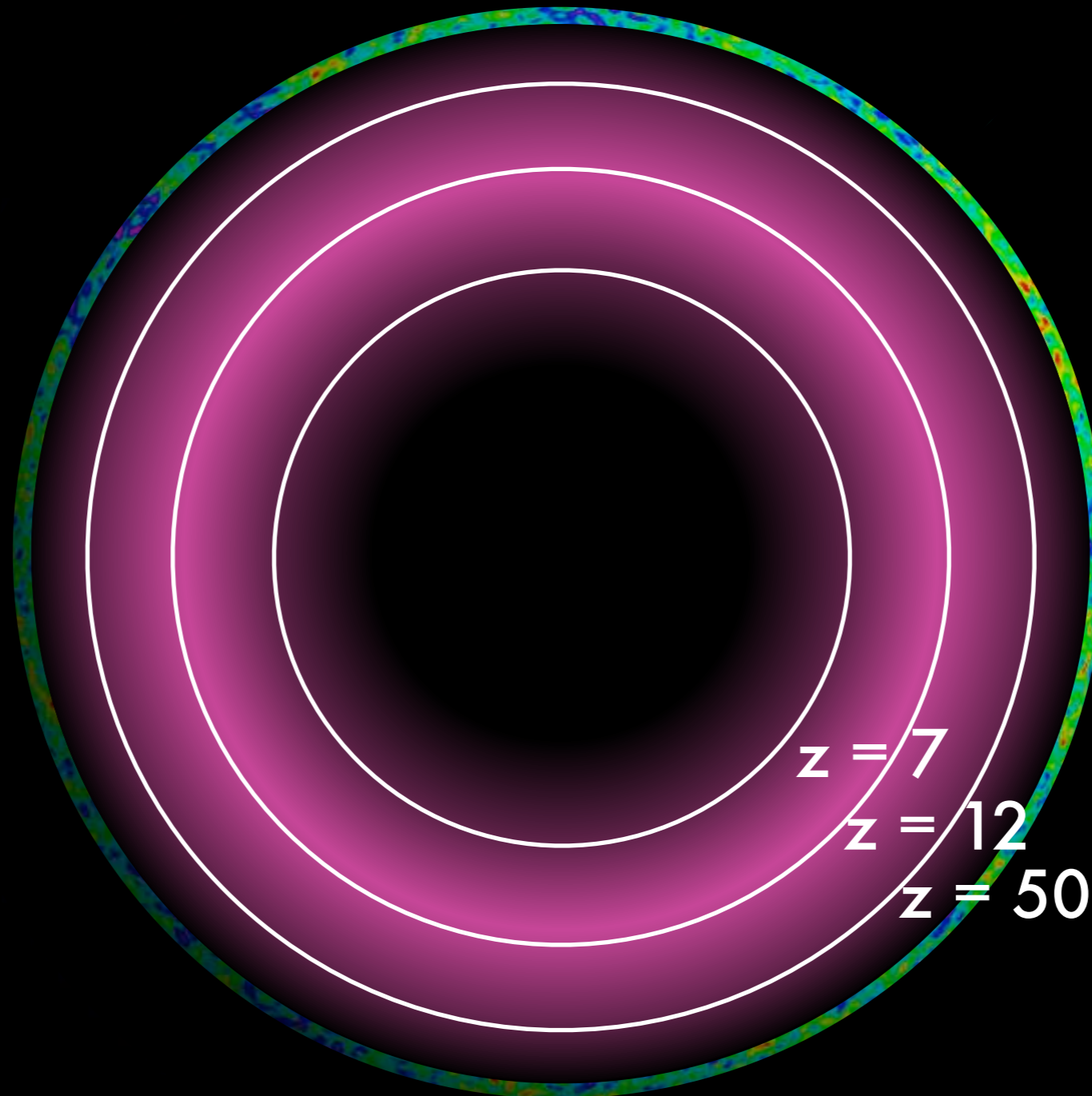
$z \approx 8$

$z < 6$

There's still a lot of open astrophysical questions.

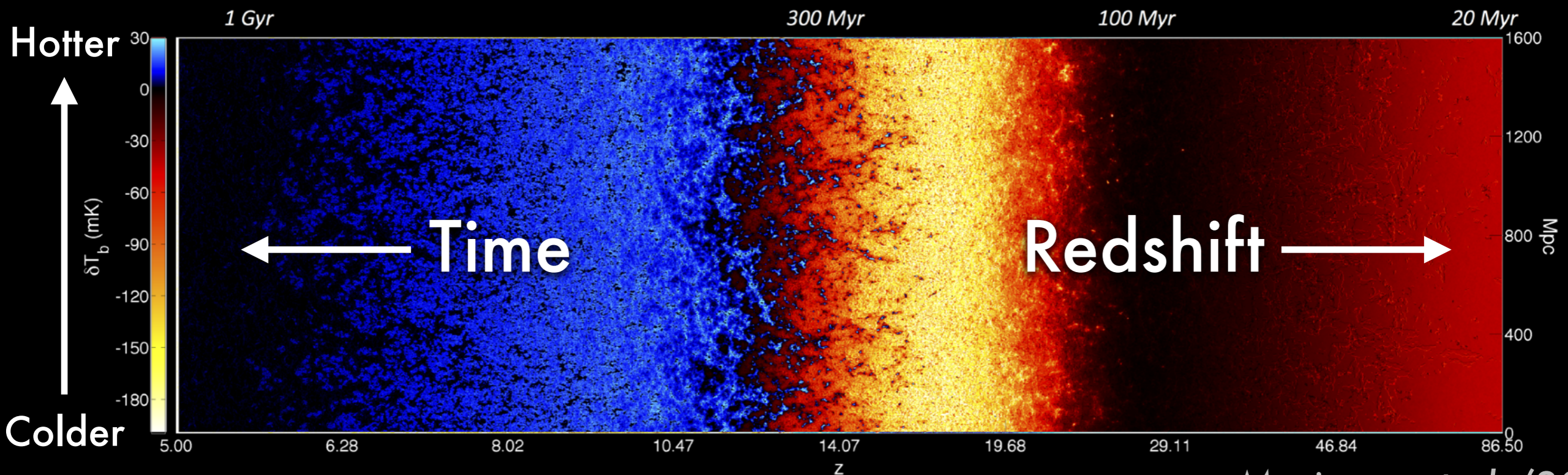
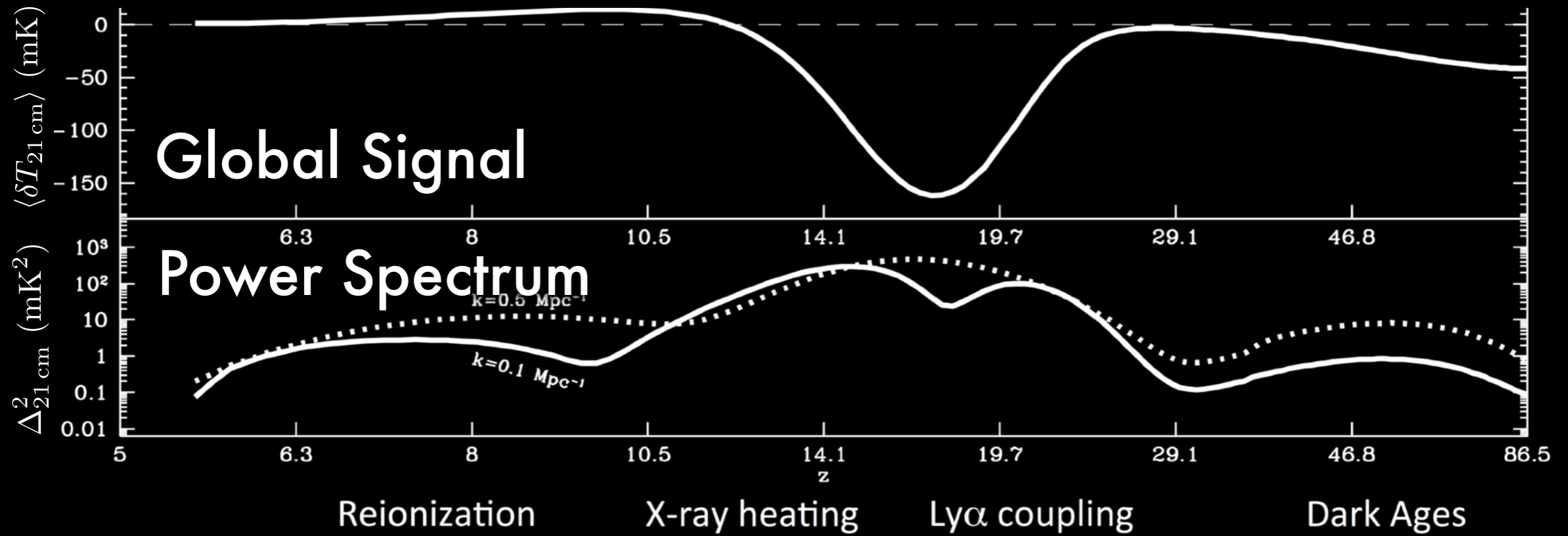
- What did the first stars look like? How and when how did they form?
- How did they die and were they the LIGO black hole progenitors? Or the seeds of supermassive black holes?
- What determined the thermal history of the intergalactic medium? Are there new physics at play?
- What reionized the universe and when?

The Cosmic Dawn is roughly half of the comoving volume of the observable universe.



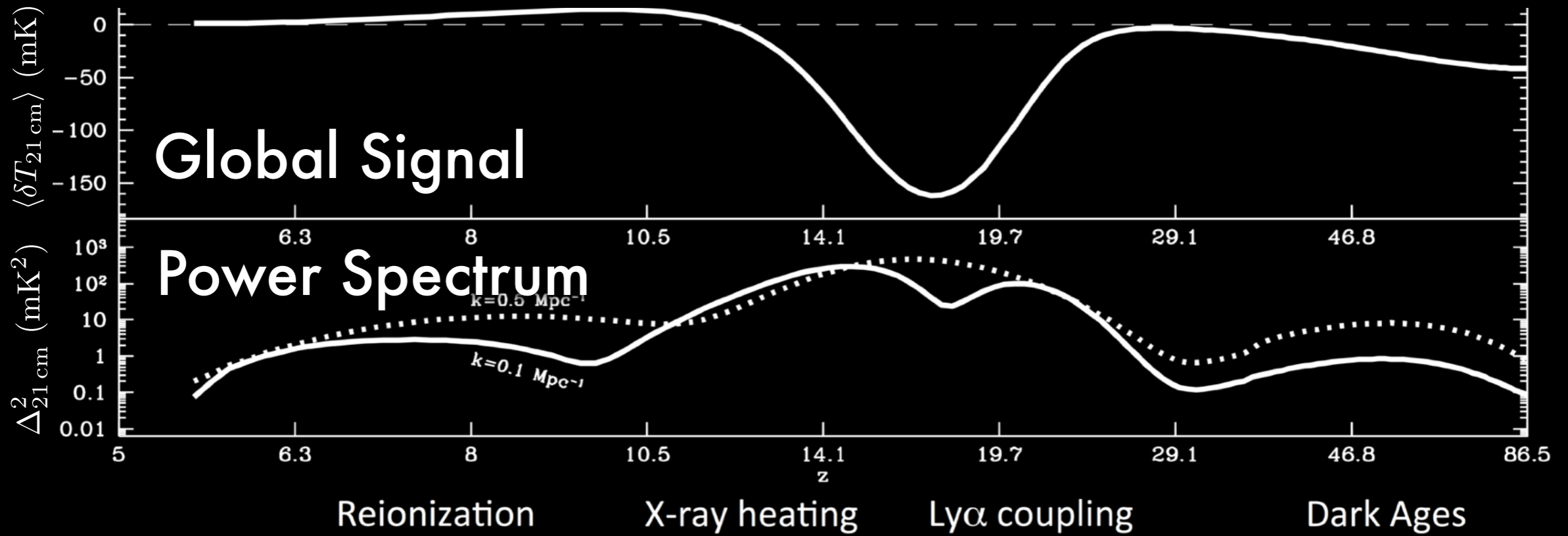
**Enormous 3D maps would
be amazing, but the first
detection will be statistical.**

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



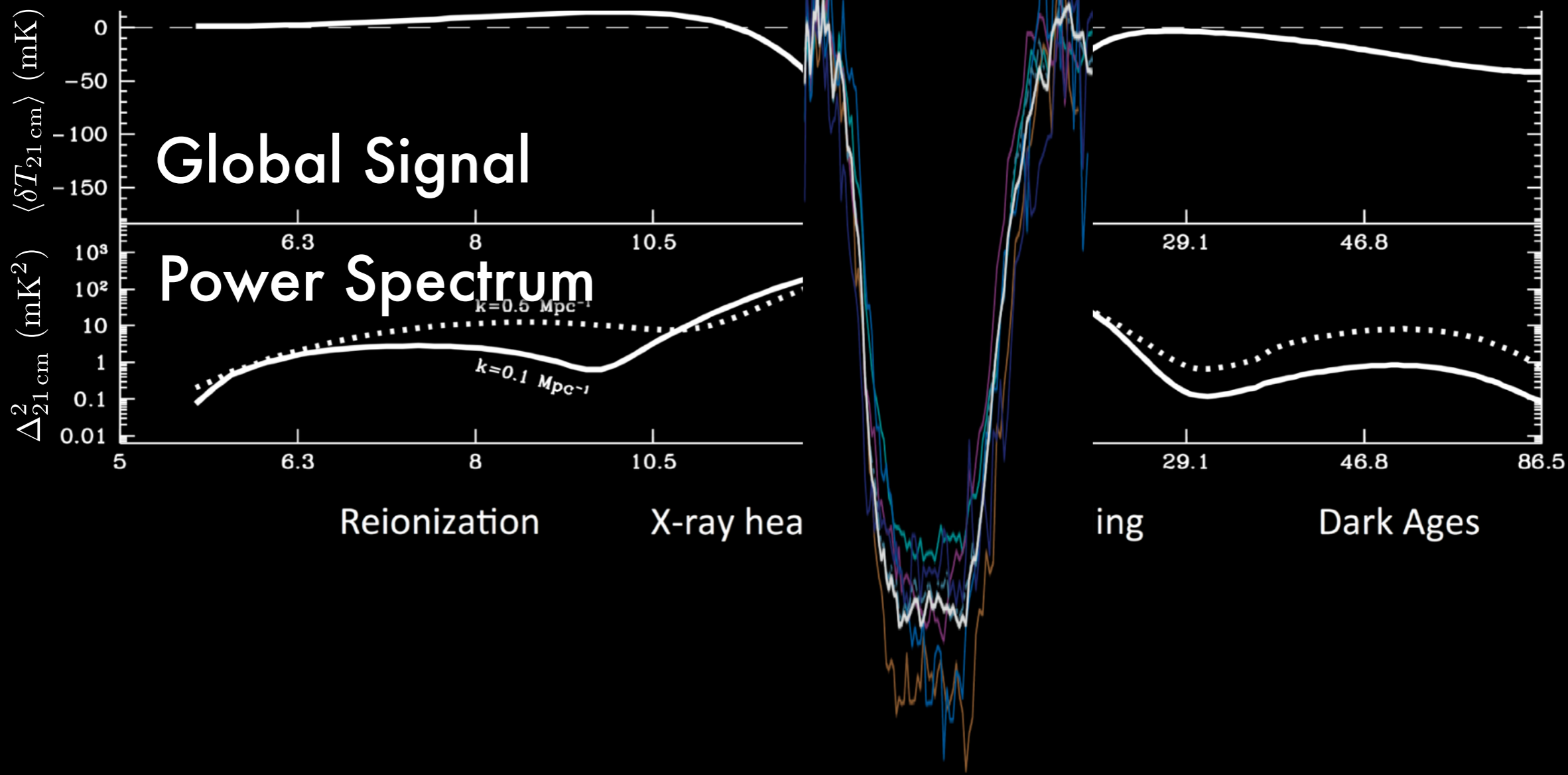
Mesinger et al. (2016)

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



And then came EDGES...

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



EDGES detected a much stronger absorption feature than anyone expected.

$$\delta T_{21 \text{ cm}} \propto \left[1 - \frac{T_{\text{CMB}}}{T_s} \right]$$

A. $T_s = T_{\text{baryon}}$ is cooled by the only thing colder than the baryons: dark matter.

- e.g. *Barkana et al. (2018)* and a ton of others

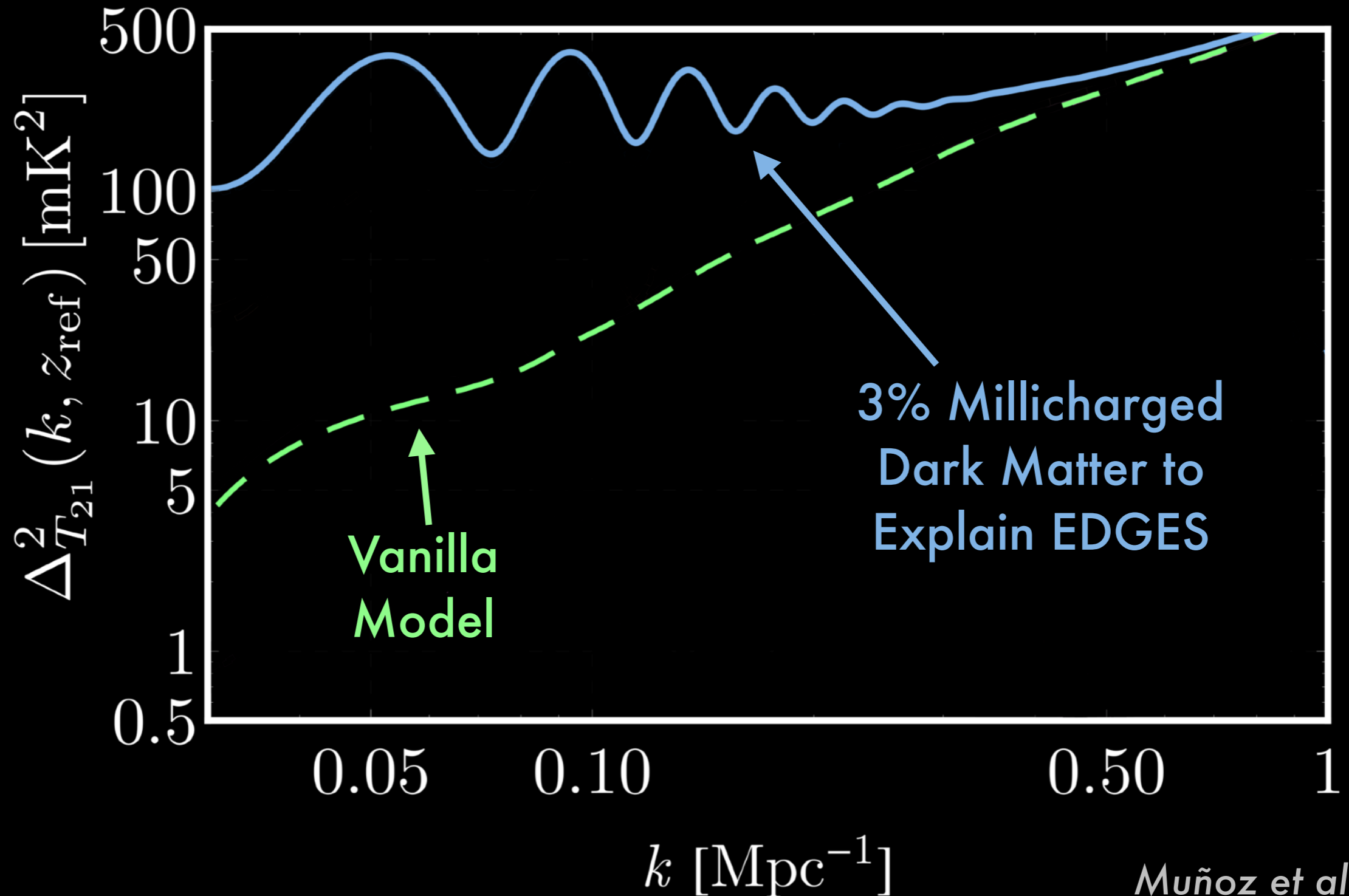
B. T_{CMB} is actually T_{rad} and is dominated by something like very early radio-loud quasars.

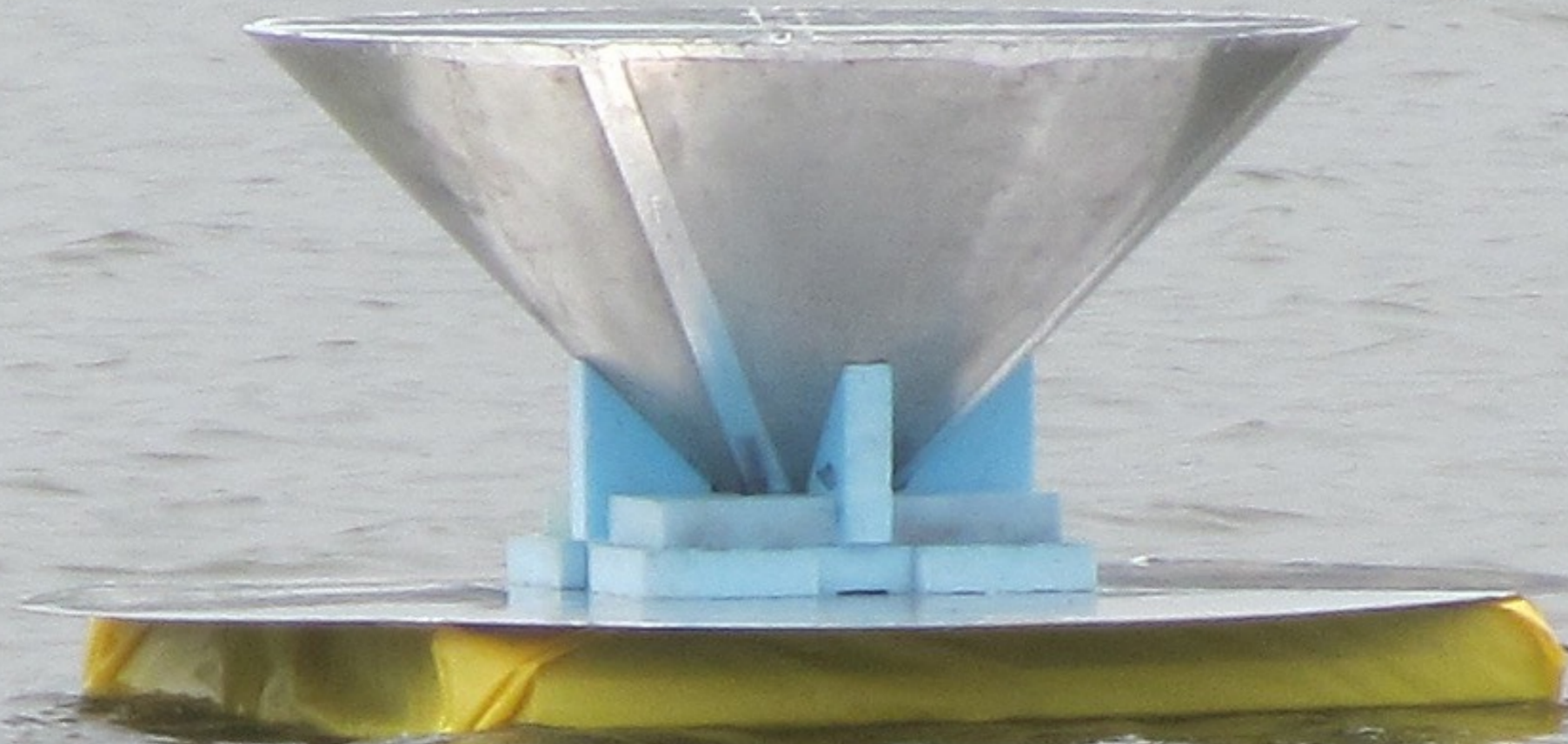
- e.g. *Feng & Holder (2018)*, *Ewall-Wice et al. (2018)*

C. EDGES is seeing some systematic

- See e.g. *the Hills et al. (2018) re-analysis of EDGES*

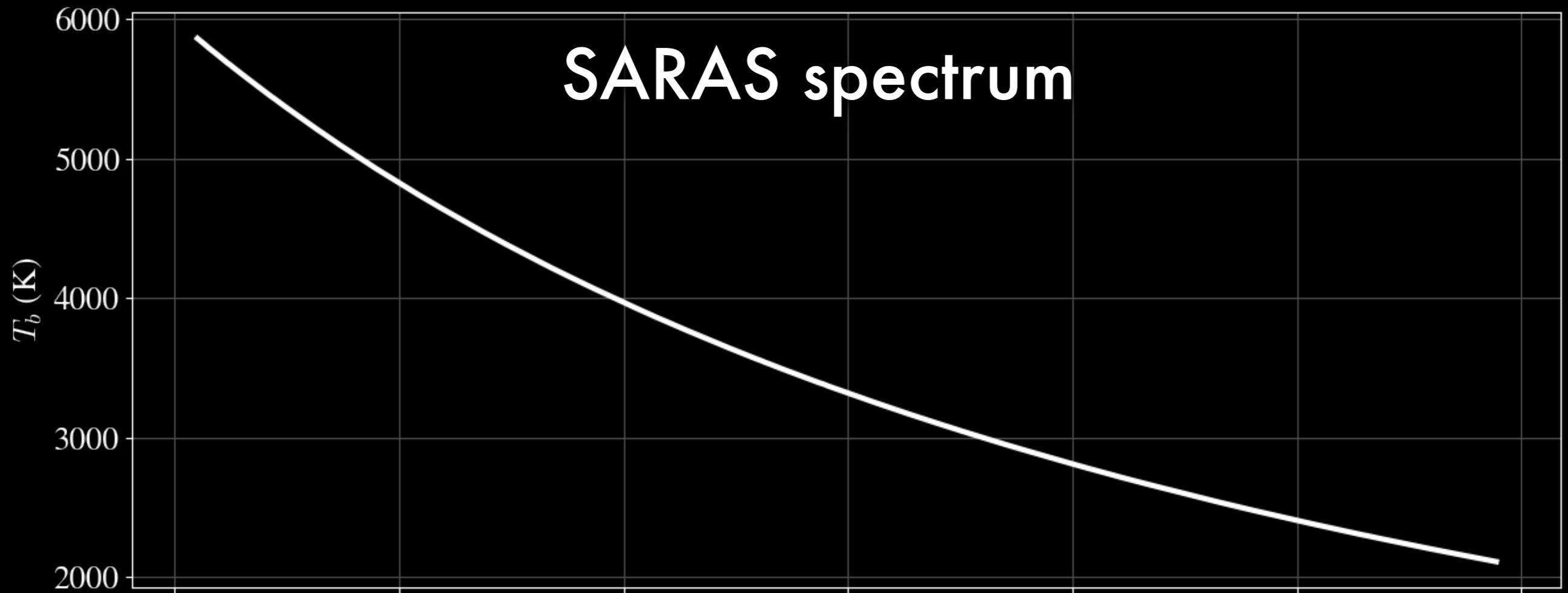
If EDGES is due to DM interactions, it should be obvious in the $z=17$ power spectrum.



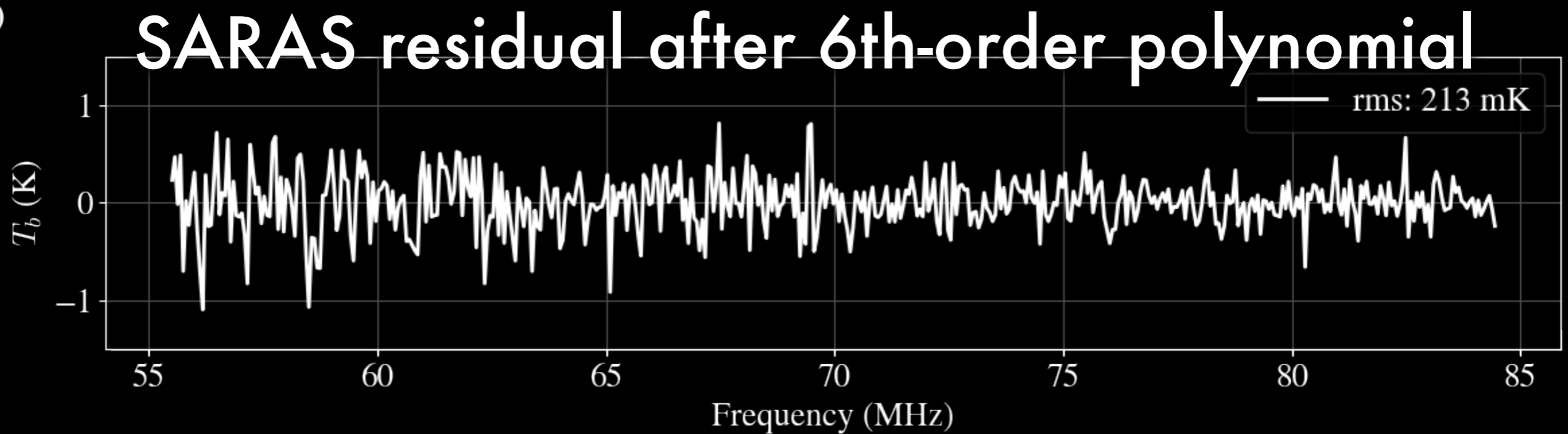


SARAS-3

(a)

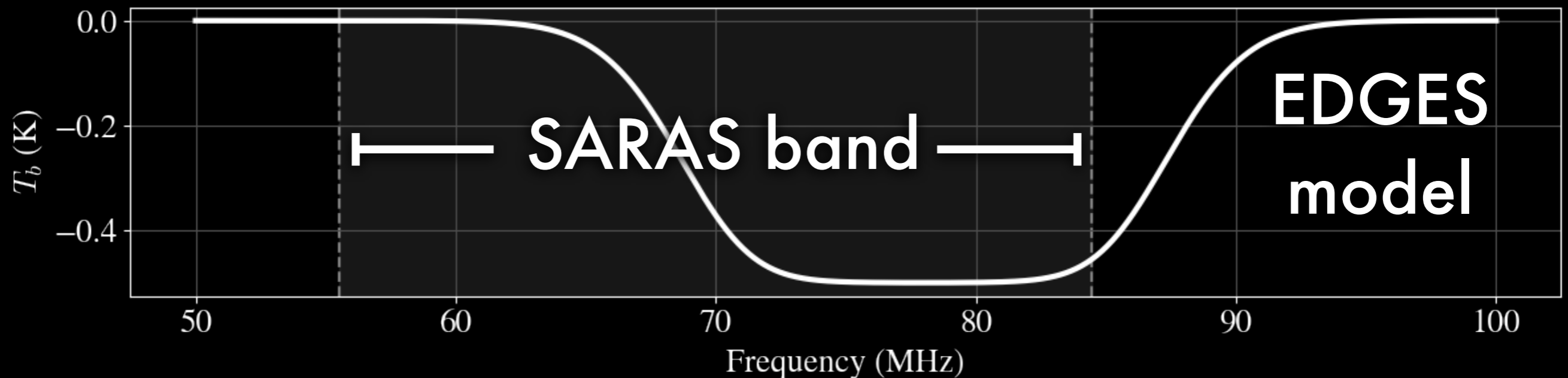


(b)



This rules out the EDGES best-fit model at $\sim 95\%$ confidence. Some caveats:

- EDGES's flattened Gaussian is by no-means the only model. It's not physically motivated, it just minimizes χ^2 .
- SARAS has a smaller band, which makes it harder to constrain the signal and leaves less lever-arm for foreground mitigation.

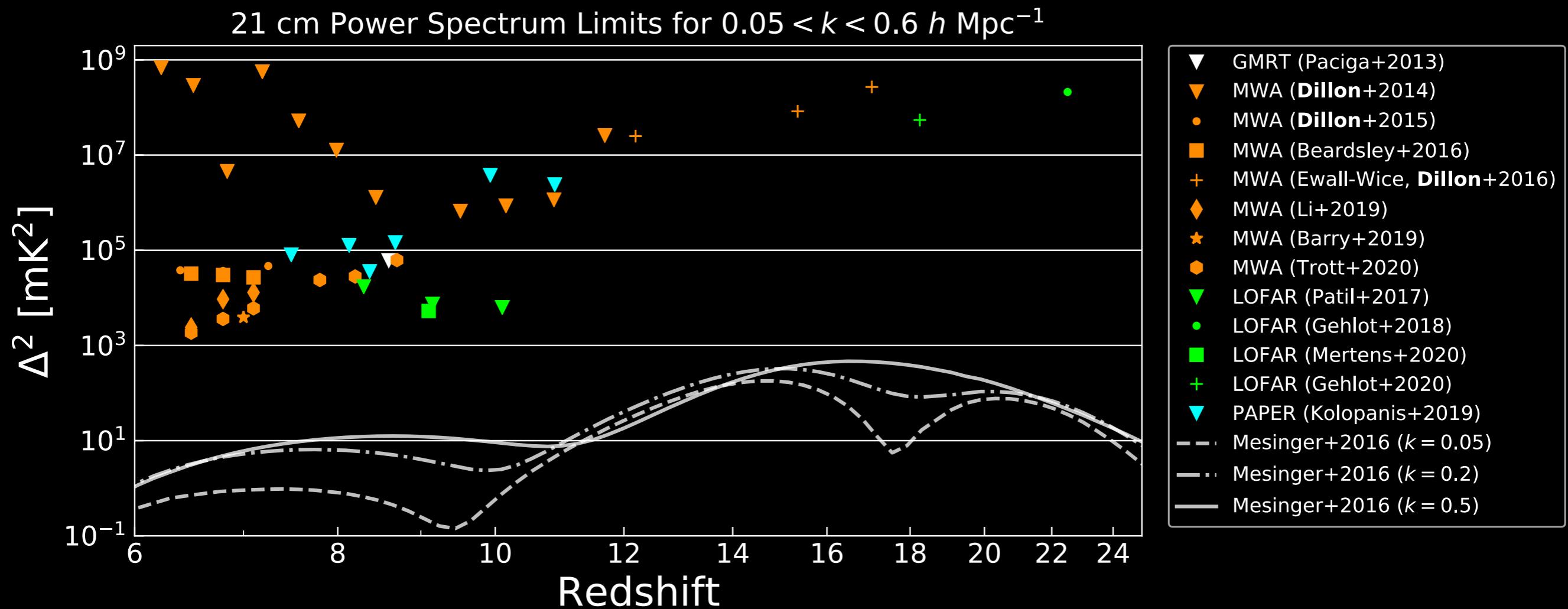


**Measuring the global signal
is hard. What about the
21 cm power spectrum?**

The first generation of interferometers for 21 cm cosmology got us started, deploying different strategies.



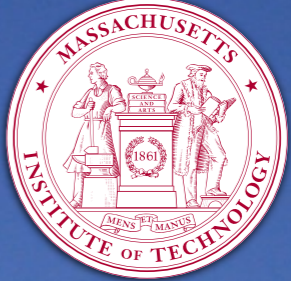
And over the last decade, power spectrum limits have been steadily coming down in the quest for the faint cosmological signal.





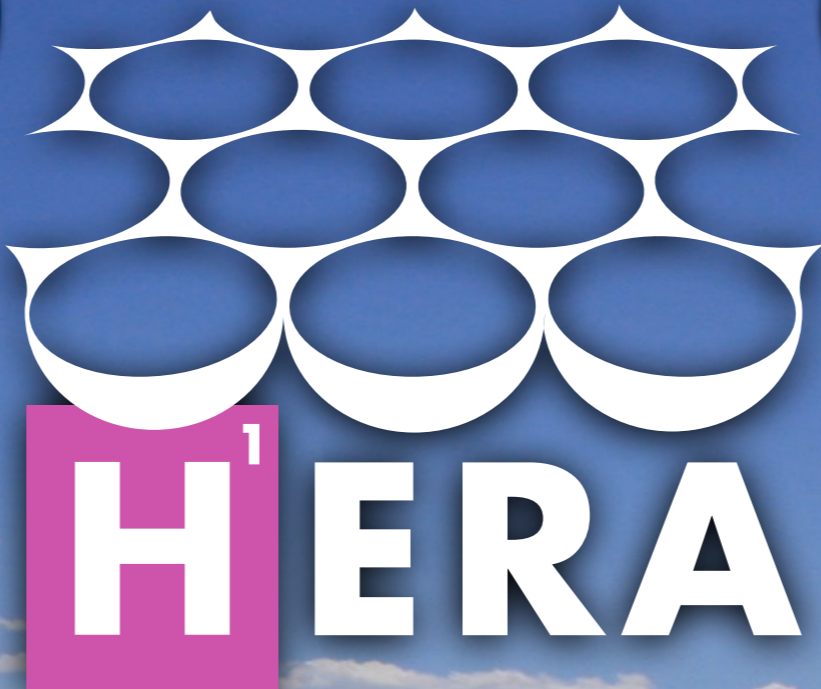
Google Earth
Data SIO, NOAA, U.S. Navy

So we went bigger...



SARAO

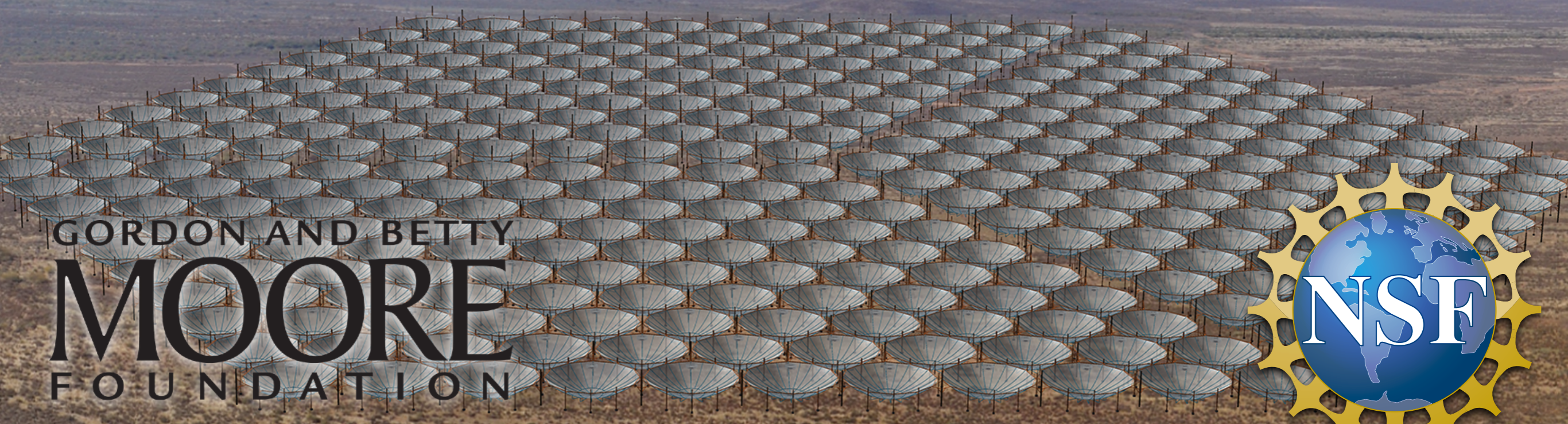
South African Radio Astronomy Observatory



The Hydrogen Epoch of Reionization Array



GORDON AND BETTY
MOORE
FOUNDATION



The 21 cm signal is faint,
so HERA is huge.

← 350 14-m diameter dishes →



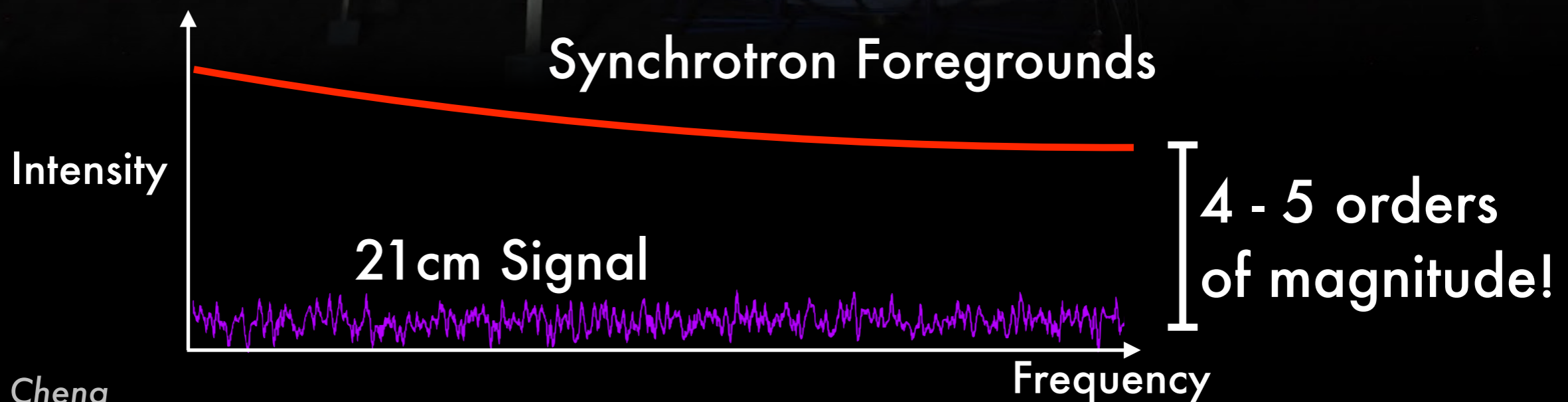
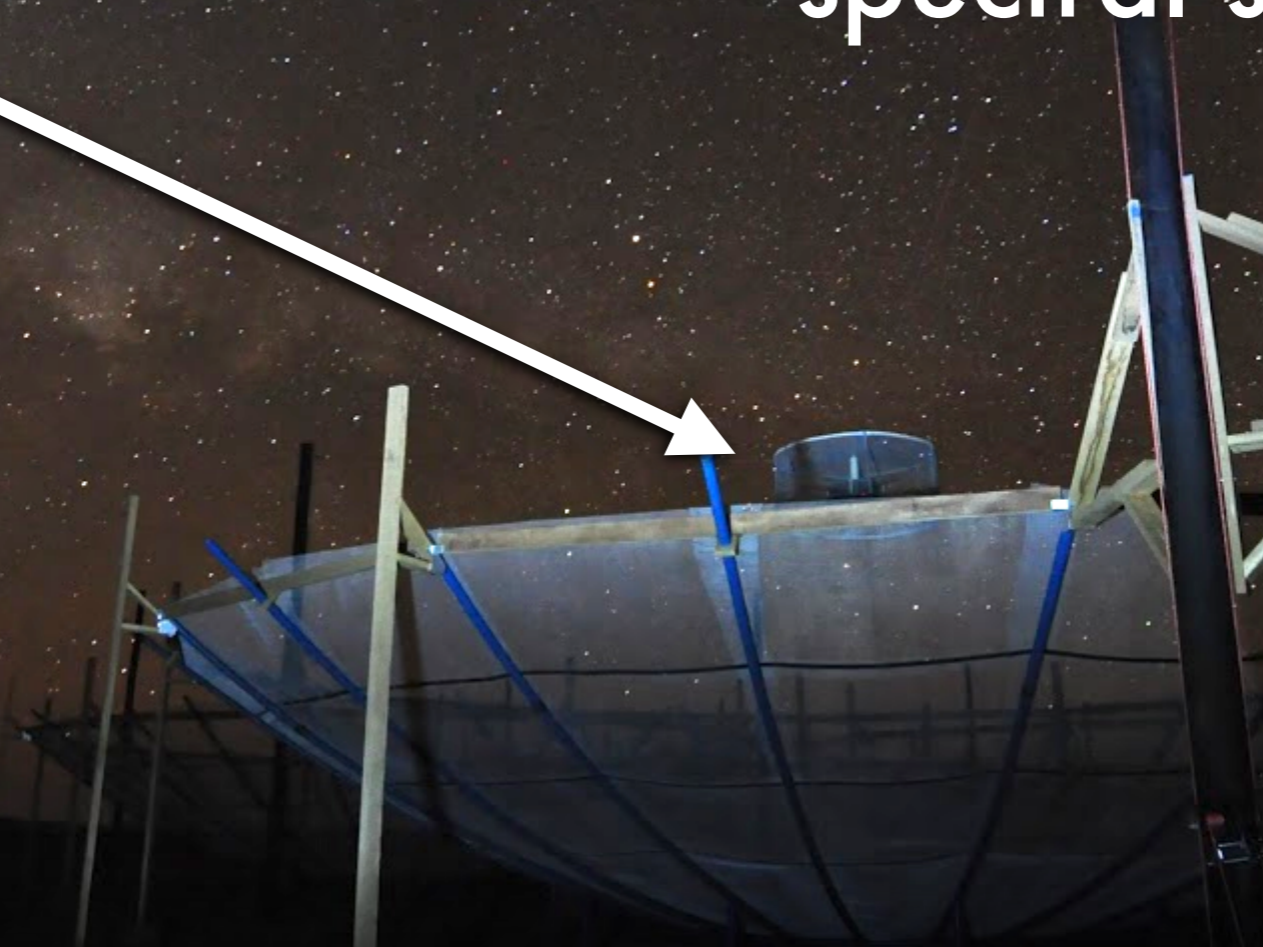
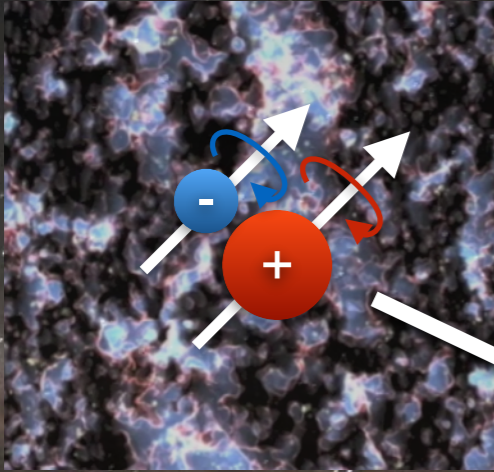


The HERA Stripe

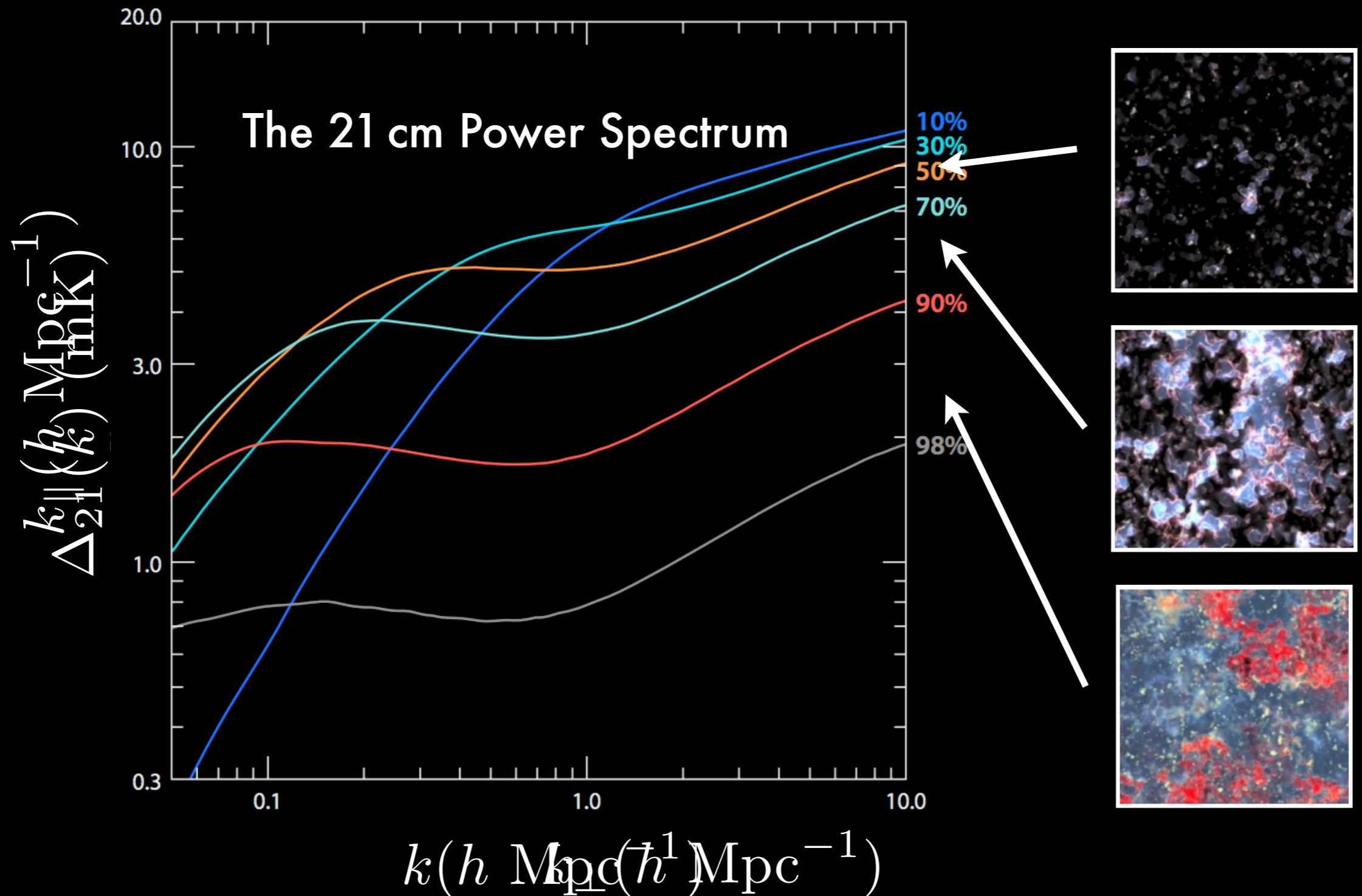
HERA is a drift scan instrument that maps out a stripe of constant declination.

Our biggest problem
is foregrounds.

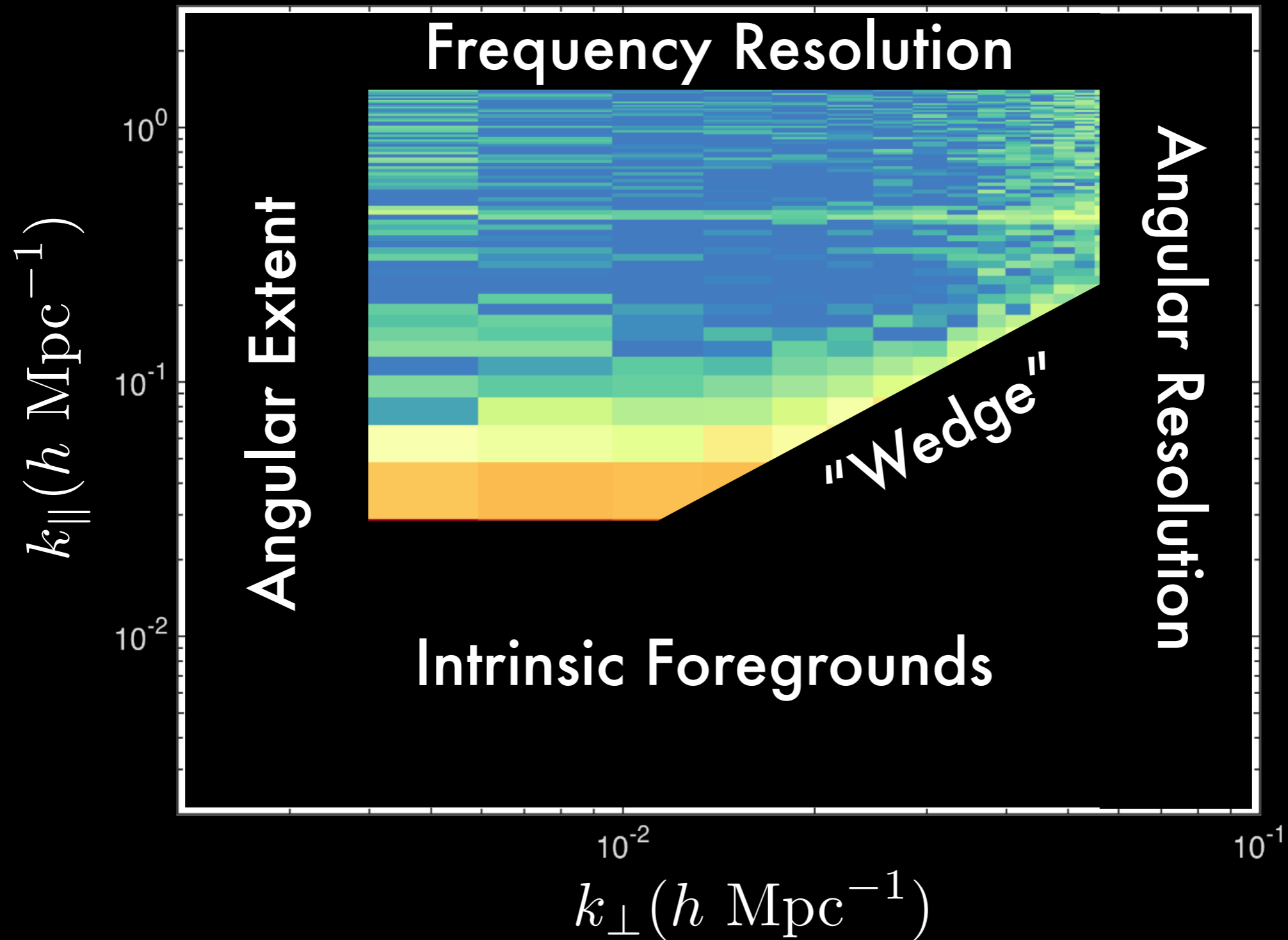
The key to separating out foregrounds is their spectral smoothness.



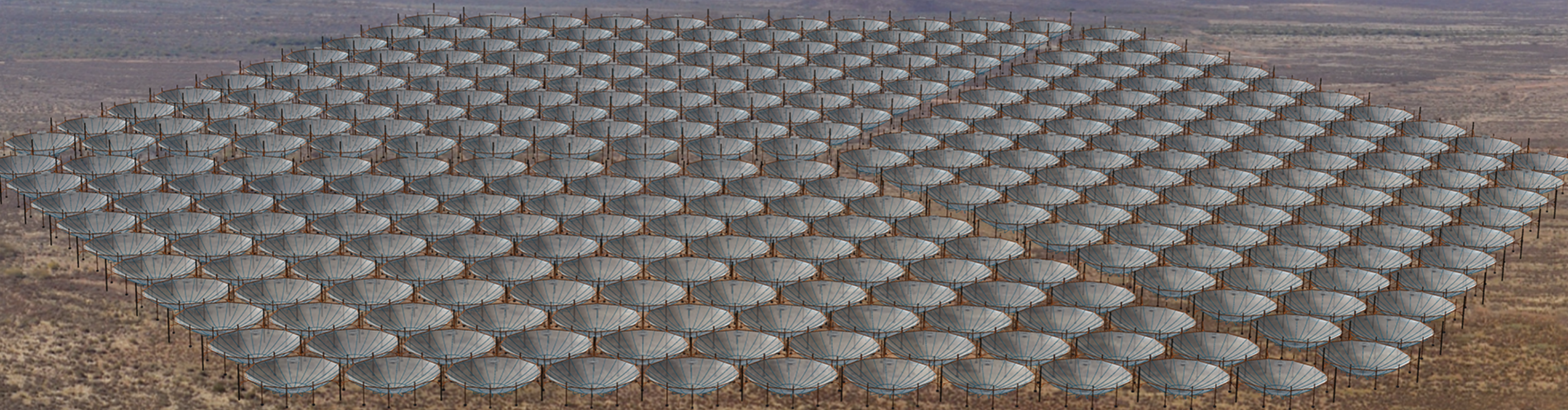
We separate out Fourier modes parallel and
 So instead of spherically averaged Fourier space...
 perpendicular to the line of sight.

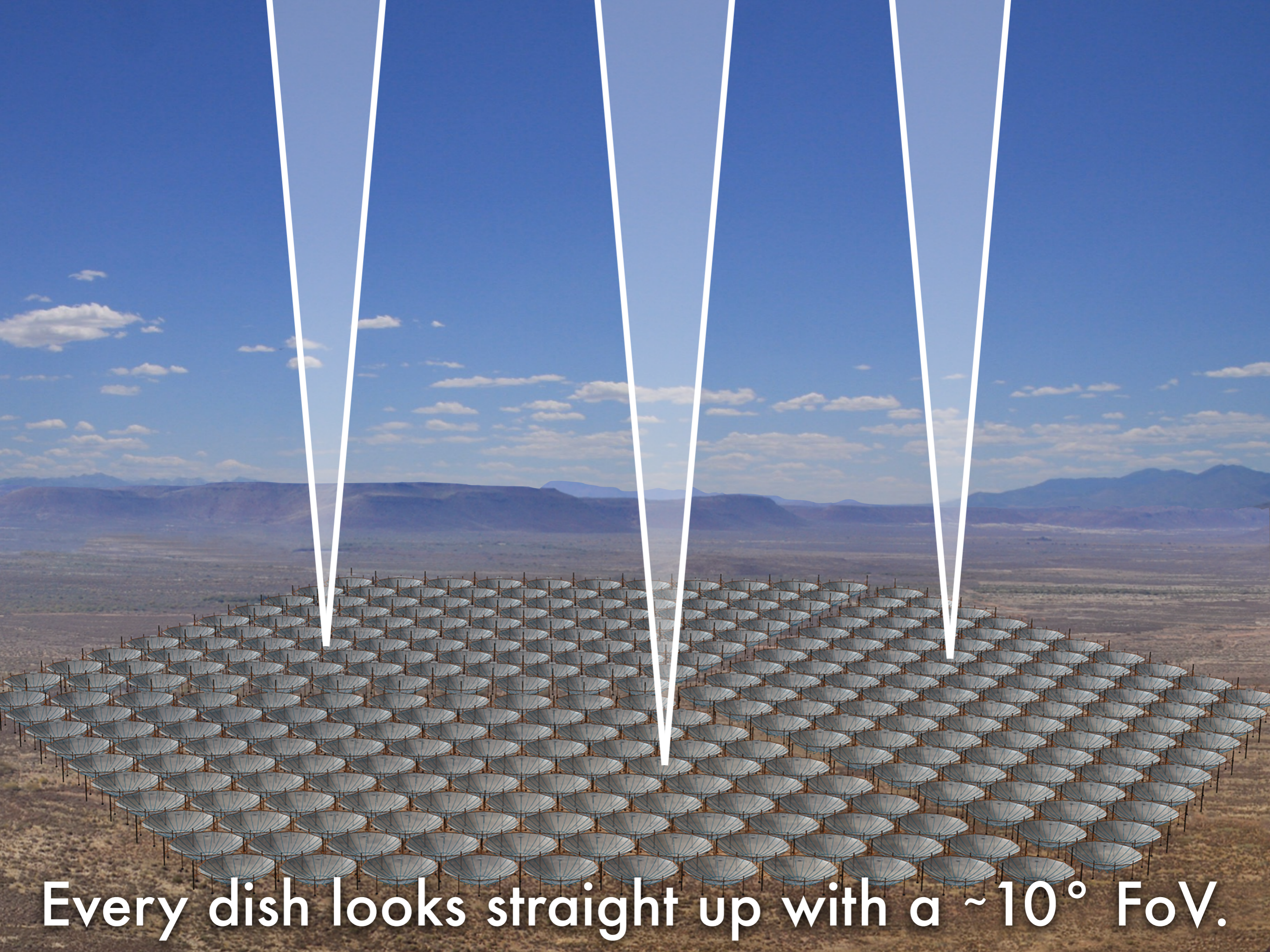


And we find a "window."



What does HERA actually measure?





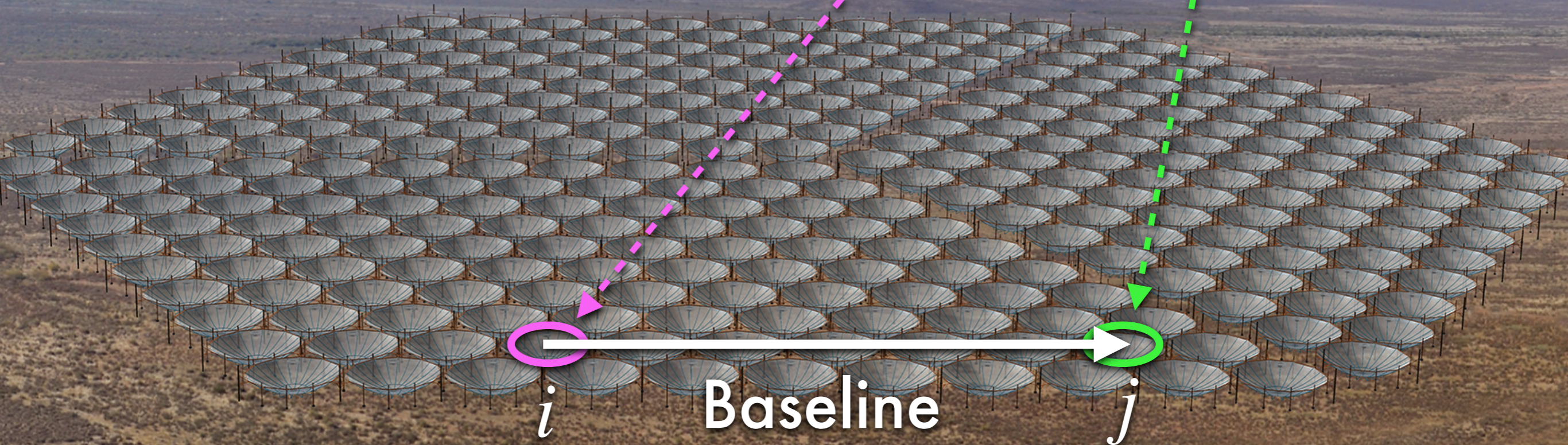
Every dish looks straight up with a $\sim 10^\circ$ FoV.

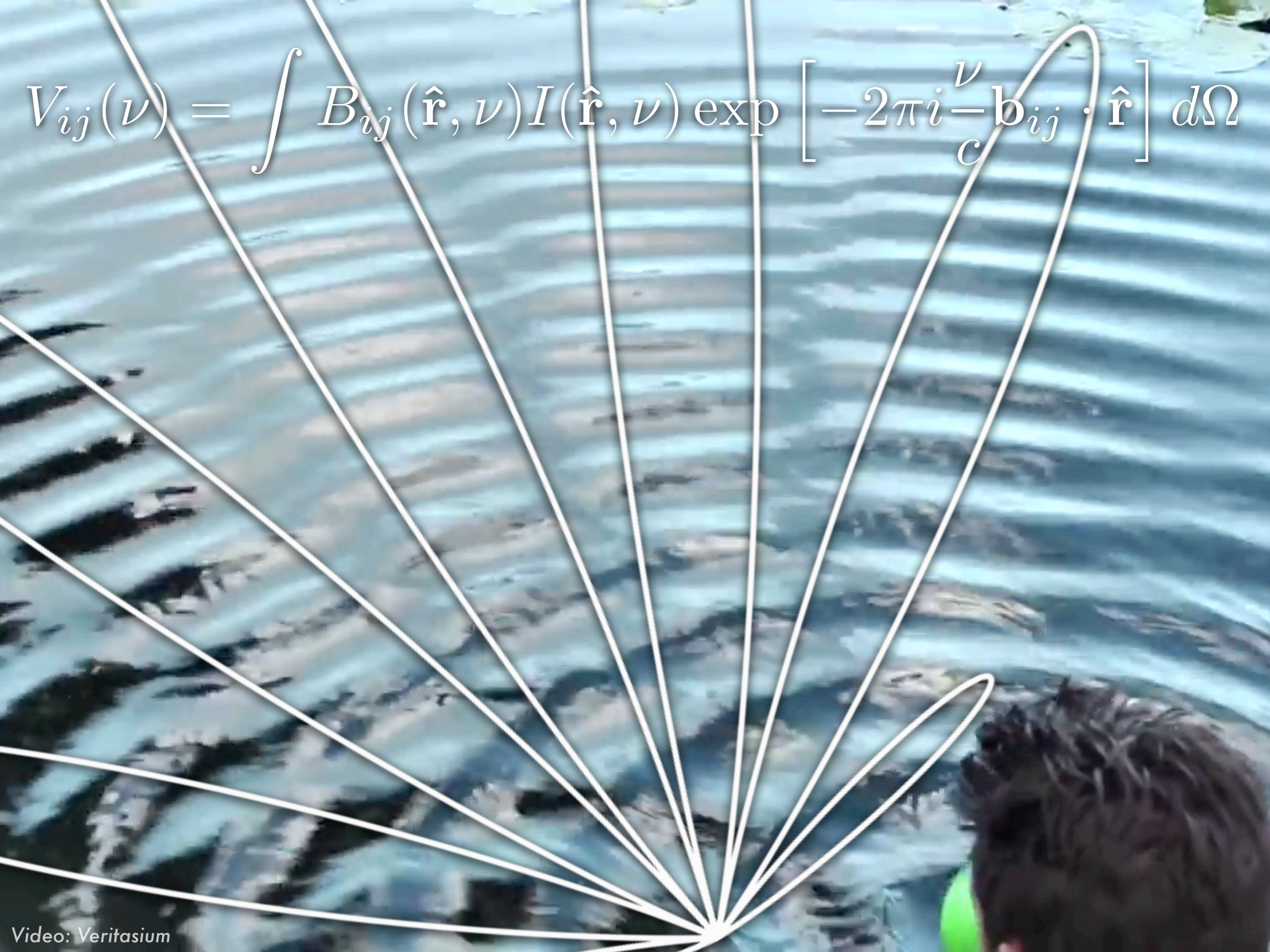
Interferometers measure Fourier modes on the sky, which we call “visibilities.”



$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

“Visibility” Beam Sky

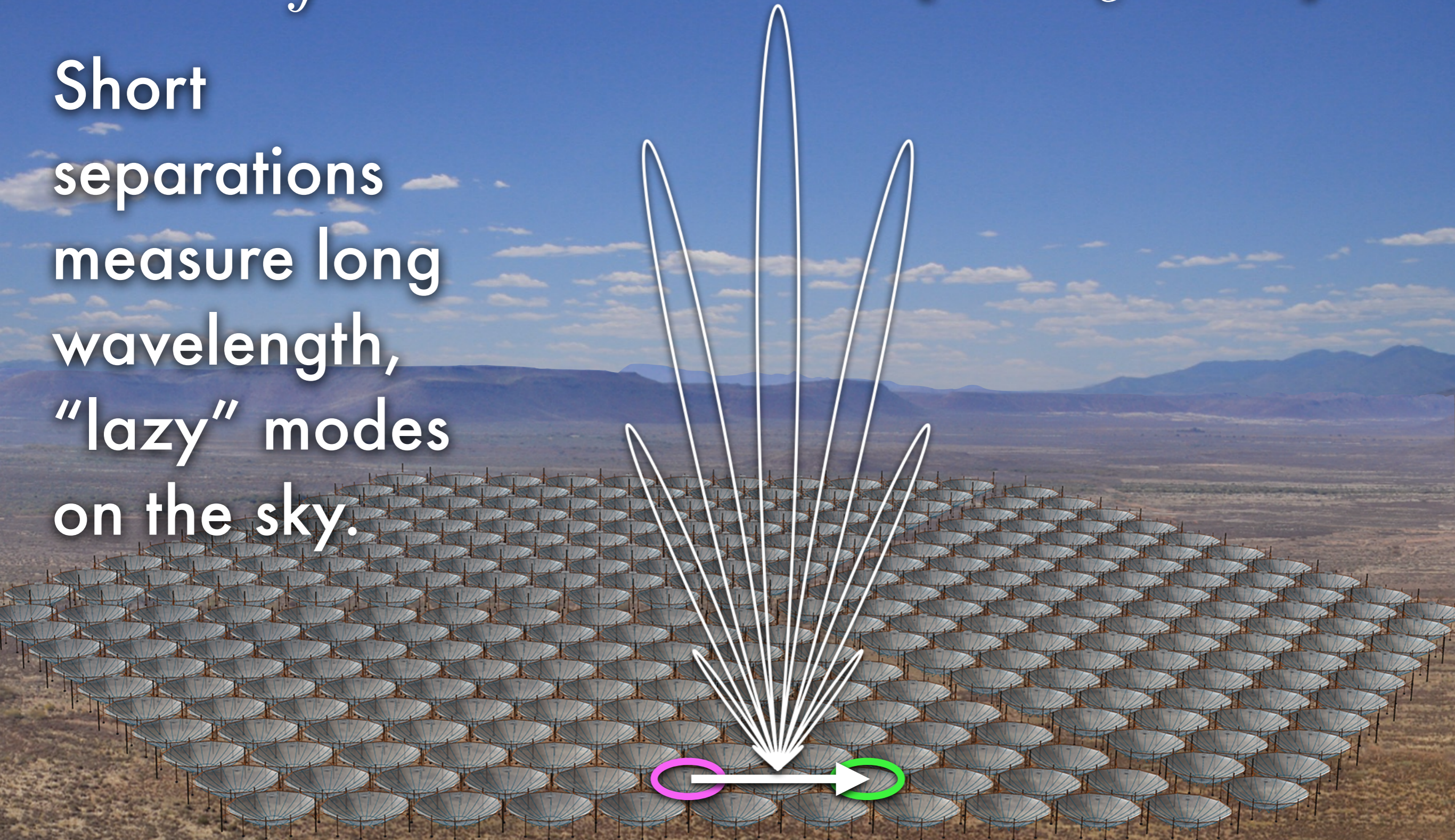




$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

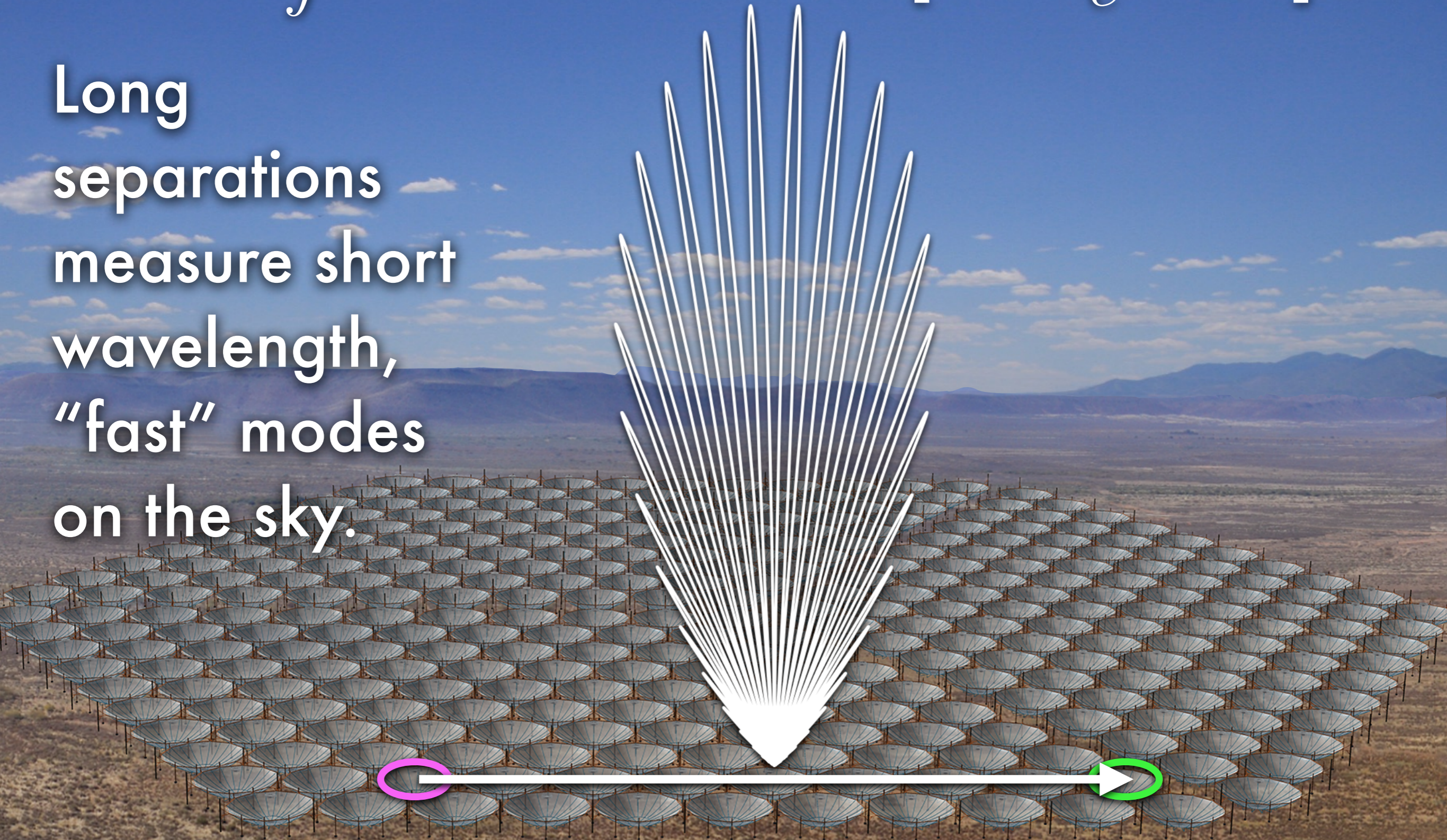
$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

Short
separations
measure long
wavelength,
“lazy” modes
on the sky.

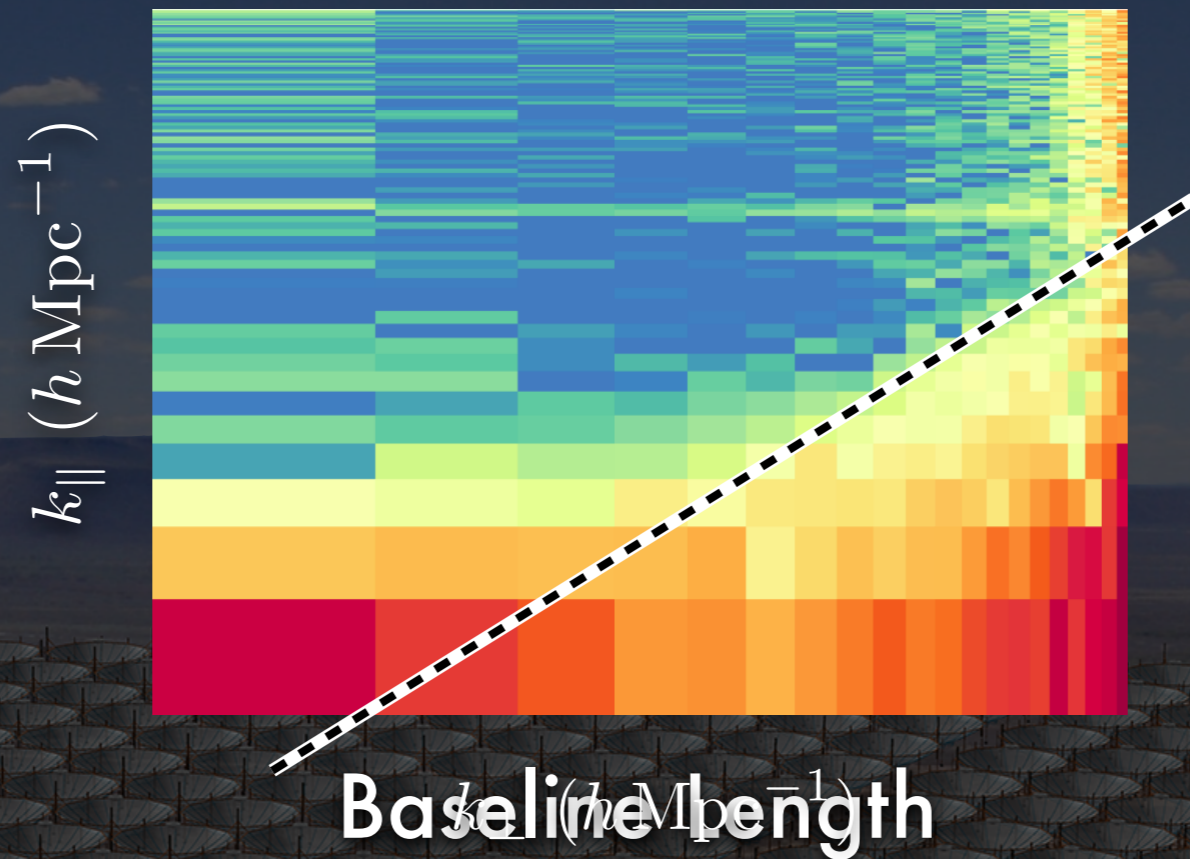


$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

Long
separations
measure short
wavelength,
“fast” modes
on the sky.

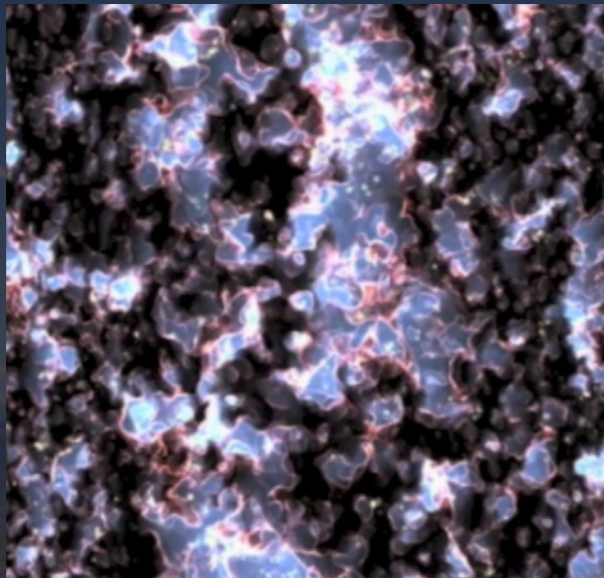


$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

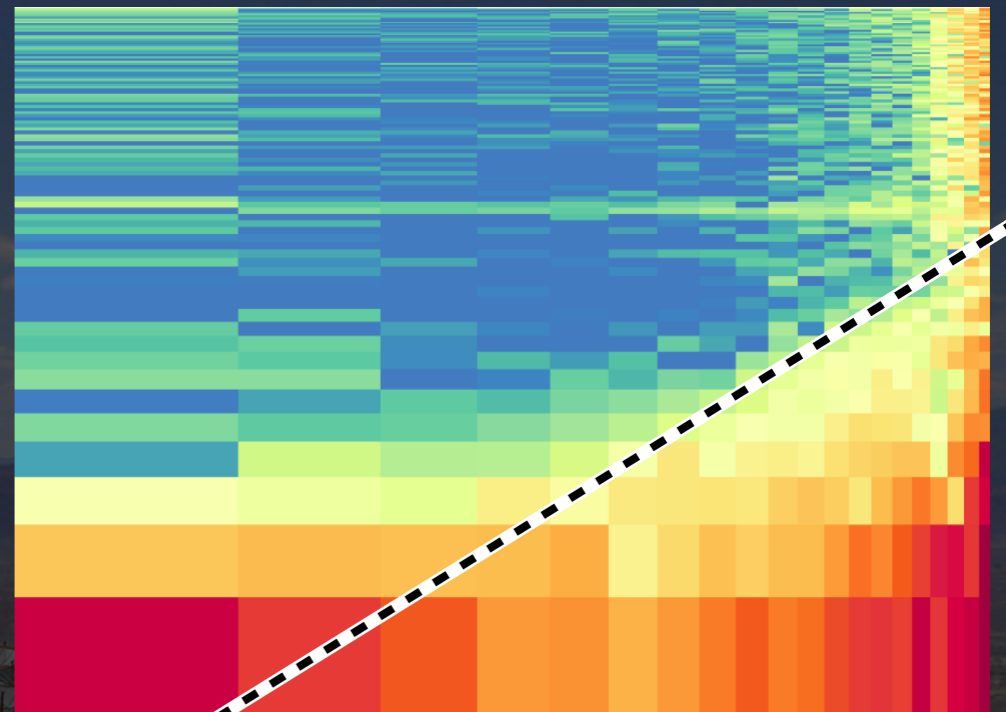


\mathbf{k}_{\perp} is effectively baseline length.

$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

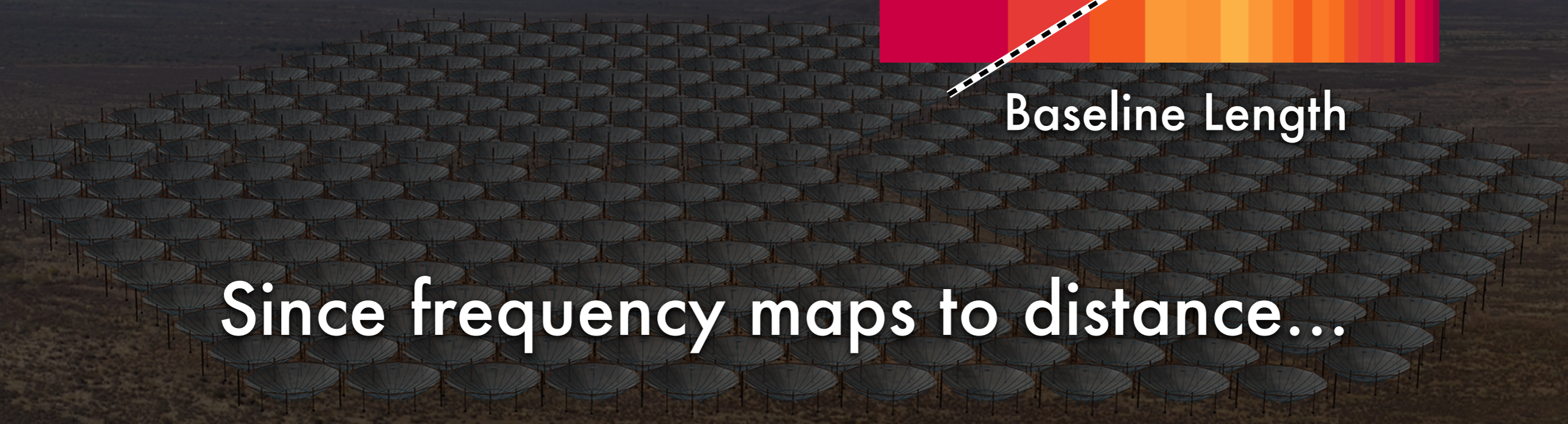


$k_{\parallel} (h \text{ Mpc}^{-1})$

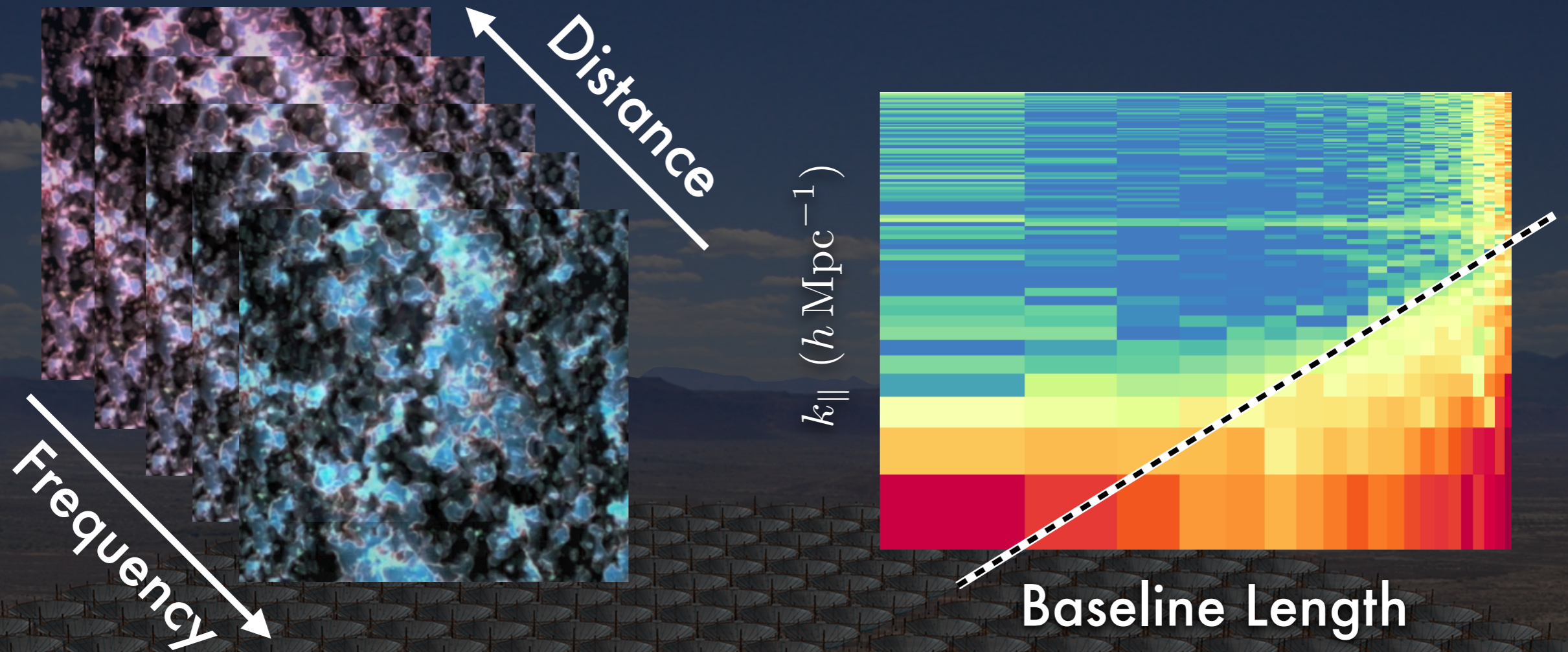


Baseline Length

Since frequency maps to distance...

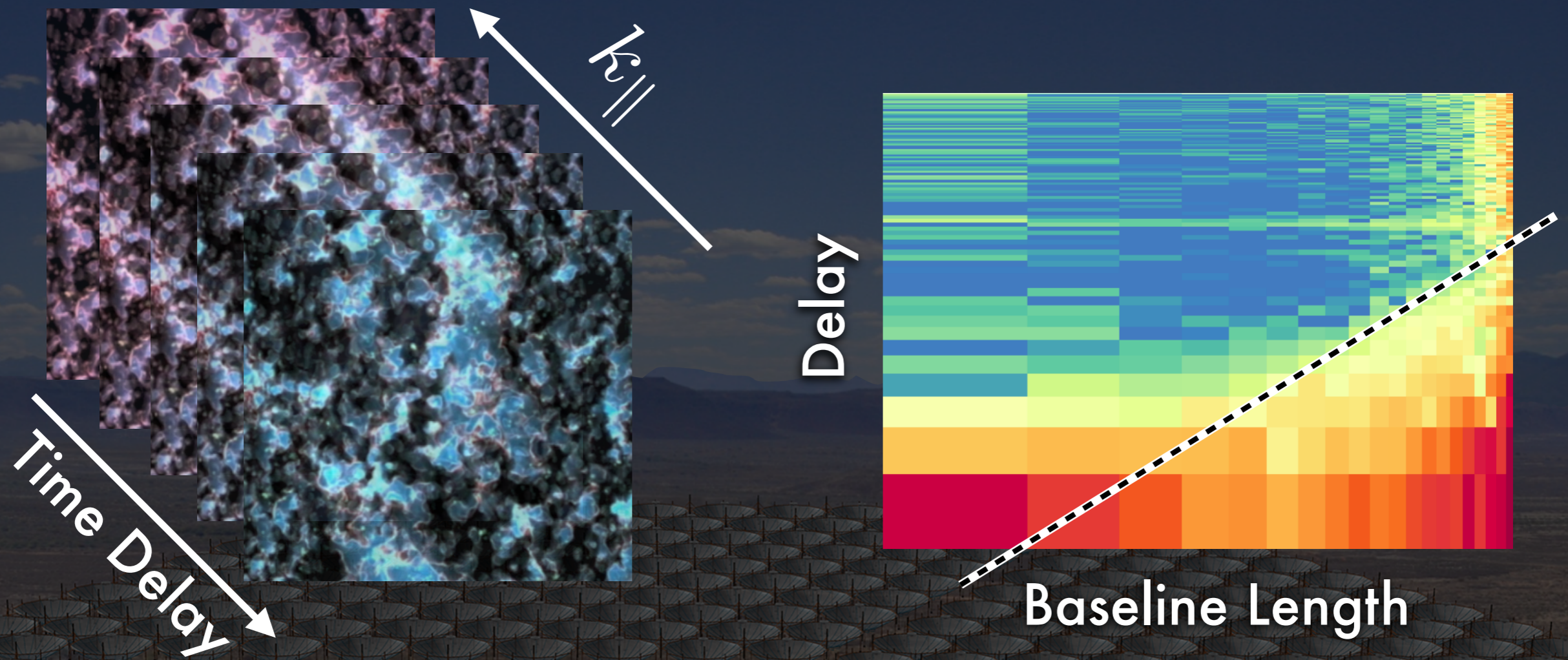


$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$



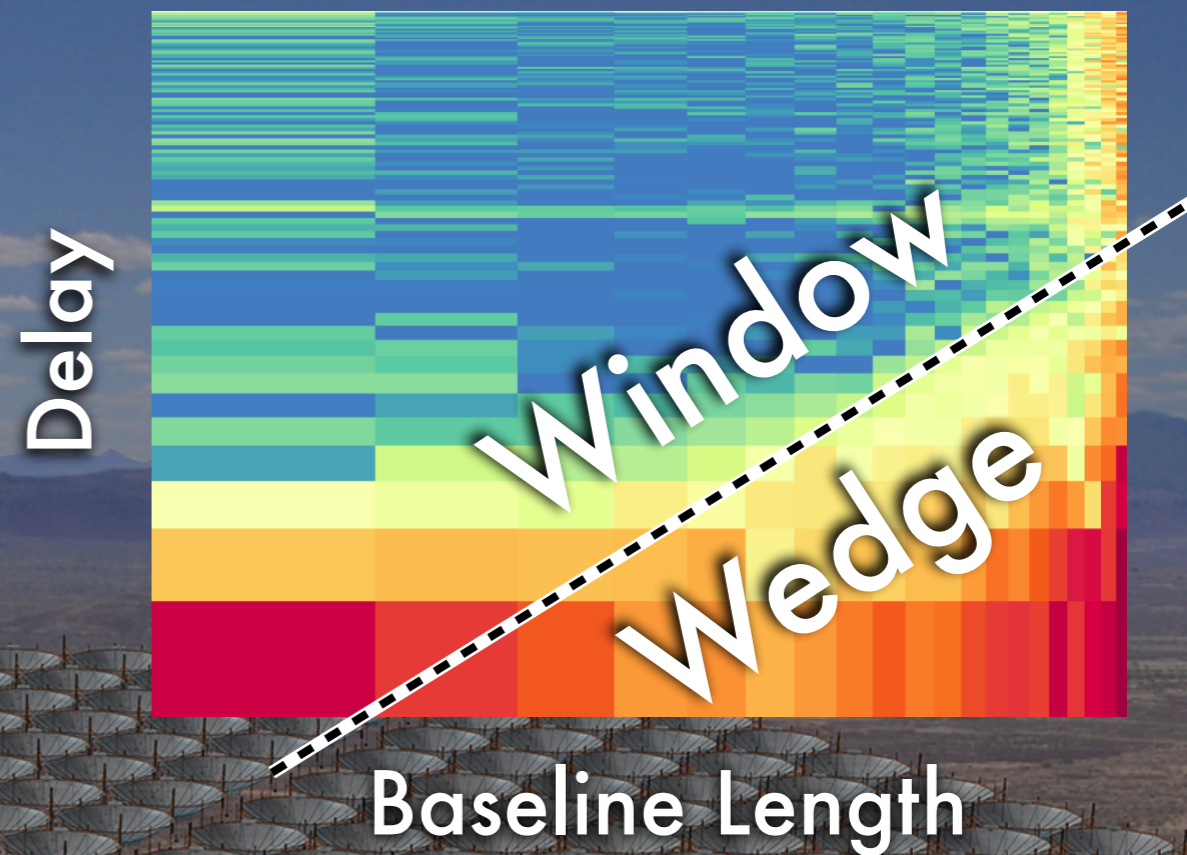
Since frequency maps to distance...

$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

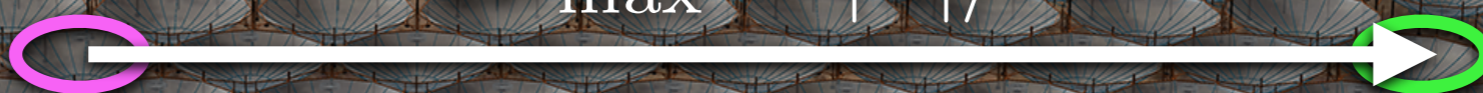


k_{\parallel} is effectively time delay.

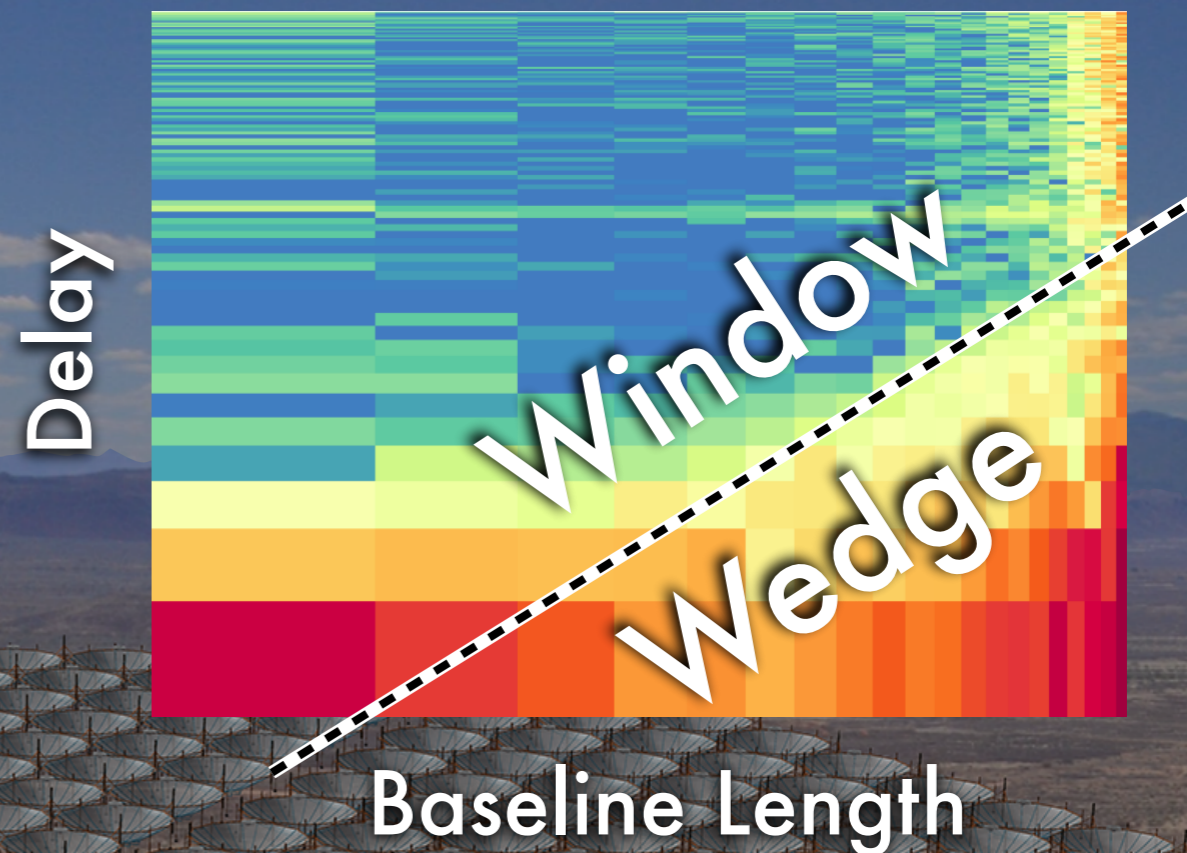
The maximum delay of foregrounds for a baseline is simply the light travel time.



$$\Delta t_{\max} = |\mathbf{b}|/c$$



Our design for
HERA's configuration
maximizes sensitivity
on short baselines.



$$\Delta t_{\max} = |\mathbf{b}|/c$$

Working outside the wedge
manages our ignorance — we
trade sensitivity for robustness.



That's not the only approach...

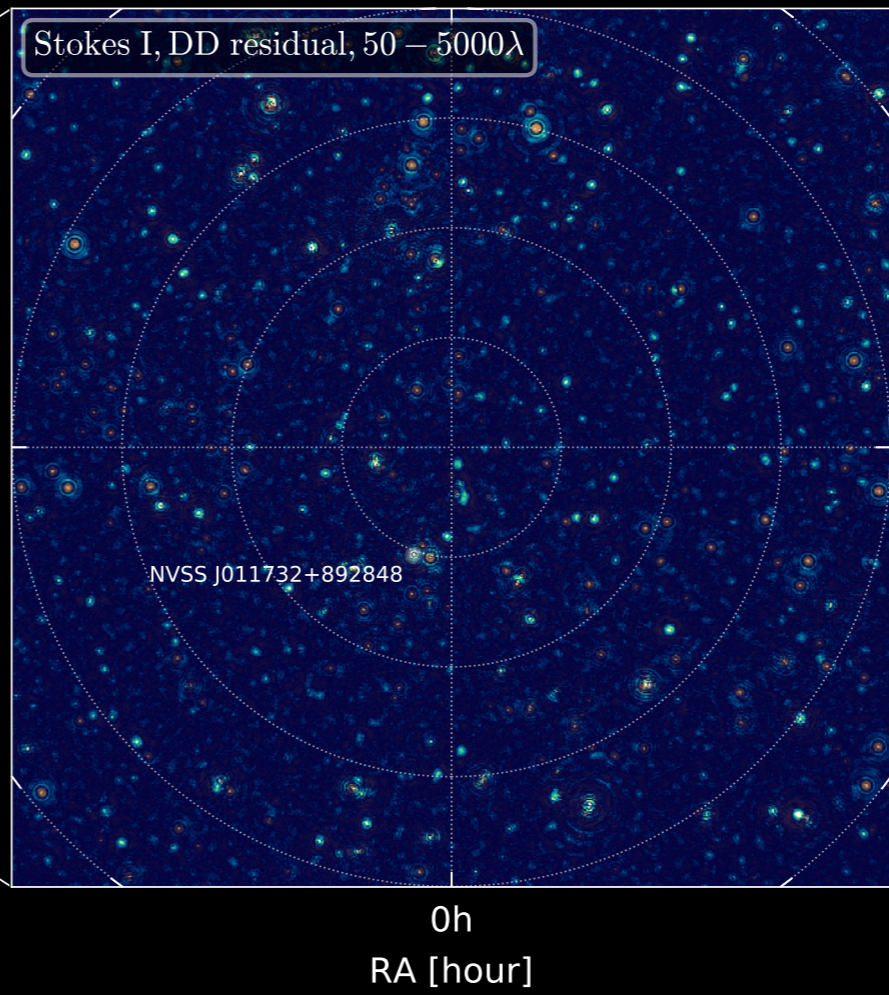
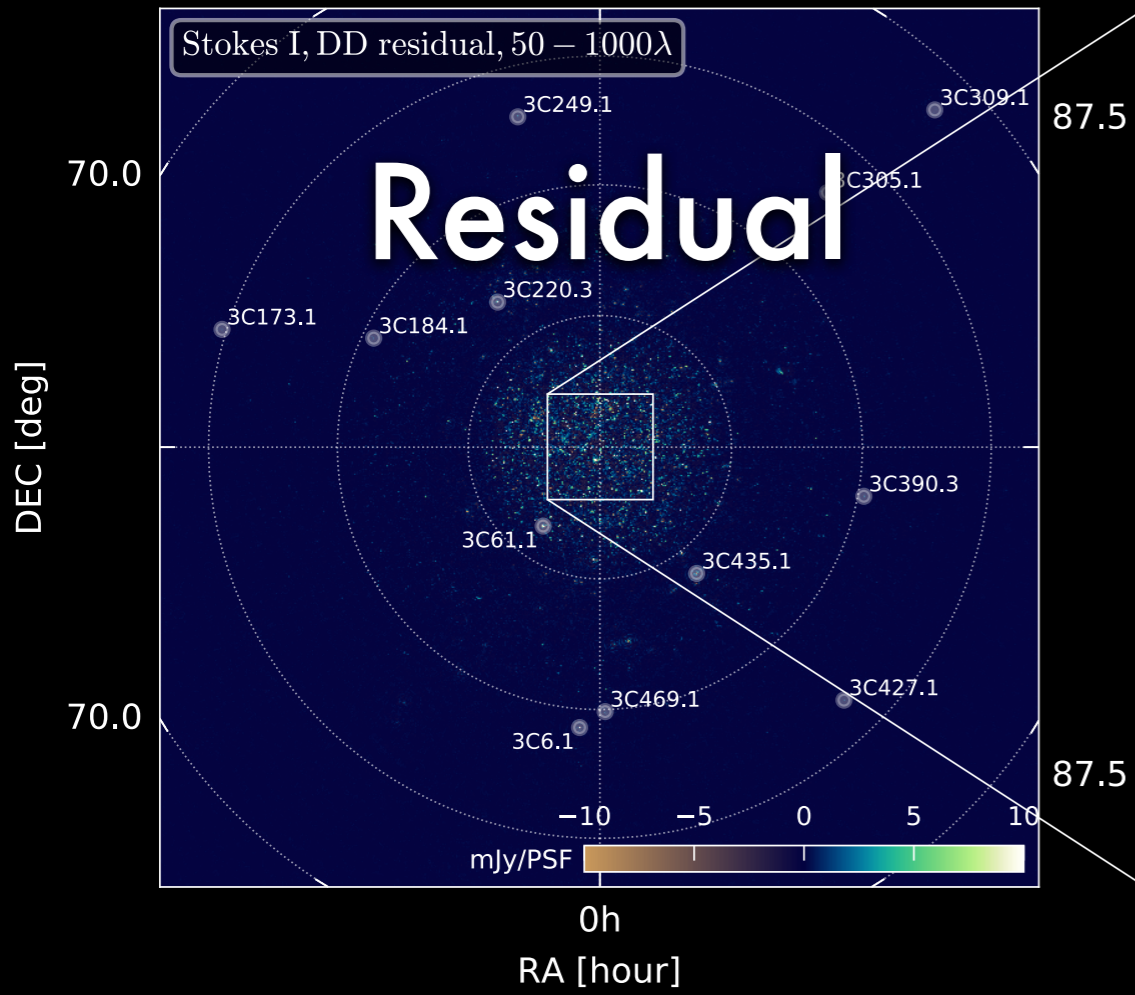
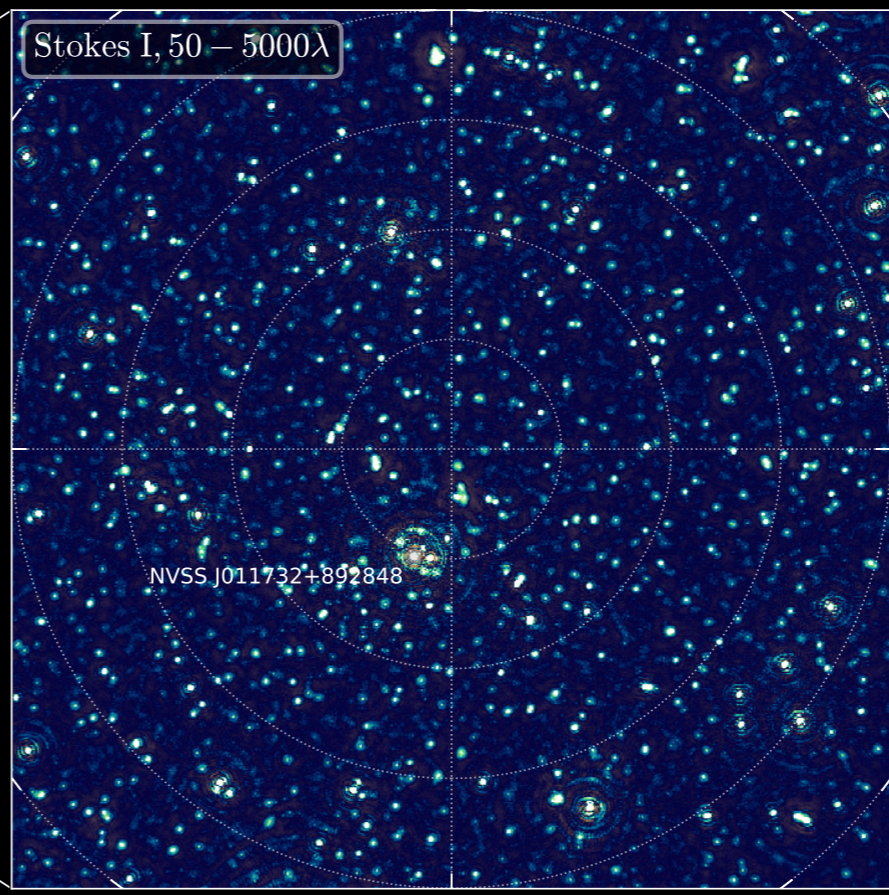
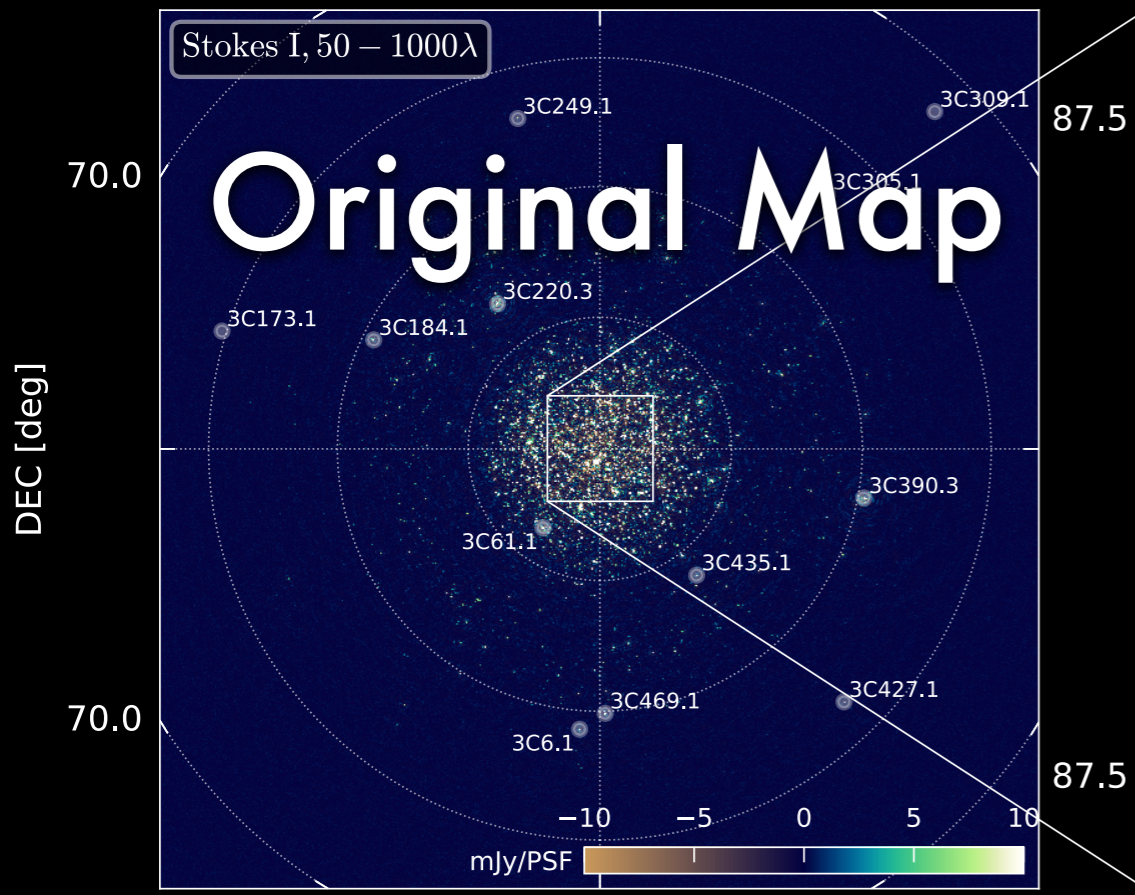
MWA



LOFAR

An aerial photograph of the SKA-Low radio telescope array. The image shows a vast, flat, arid landscape with sparse, low-lying vegetation and scattered trees. In the foreground and middle ground, there are numerous large, complex metal structures that form the radio telescope array. These structures are arranged in a grid-like pattern, with many tall, thin masts and cross-arms. The ground is a mix of brown and tan colors, with some areas appearing to be covered in a fine mesh or fabric. In the background, there are some low, flat-topped hills or mesas under a clear sky. The overall scene is a wide, open plain with a few small buildings or structures scattered throughout.

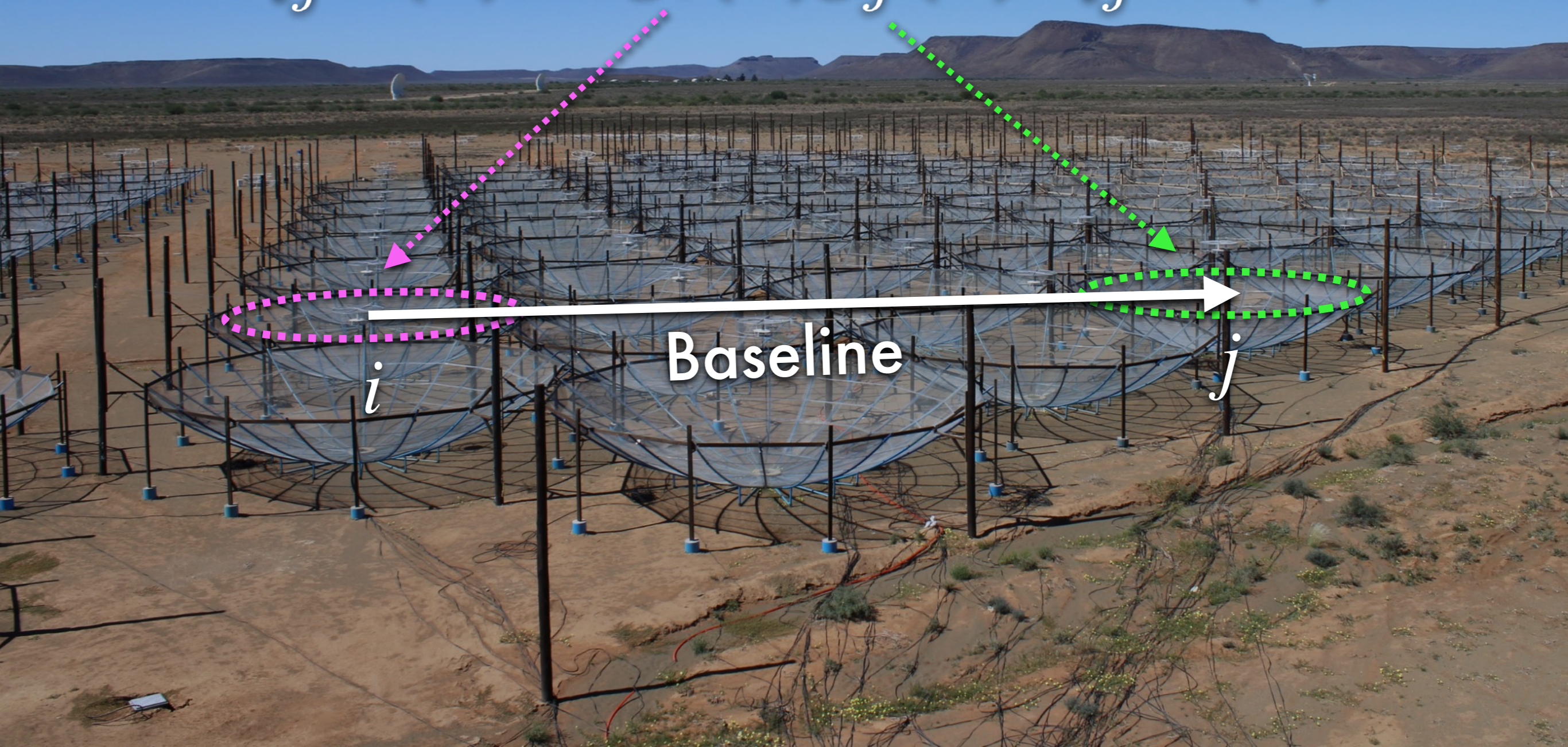
SKA-Low is taking the same basic approach.



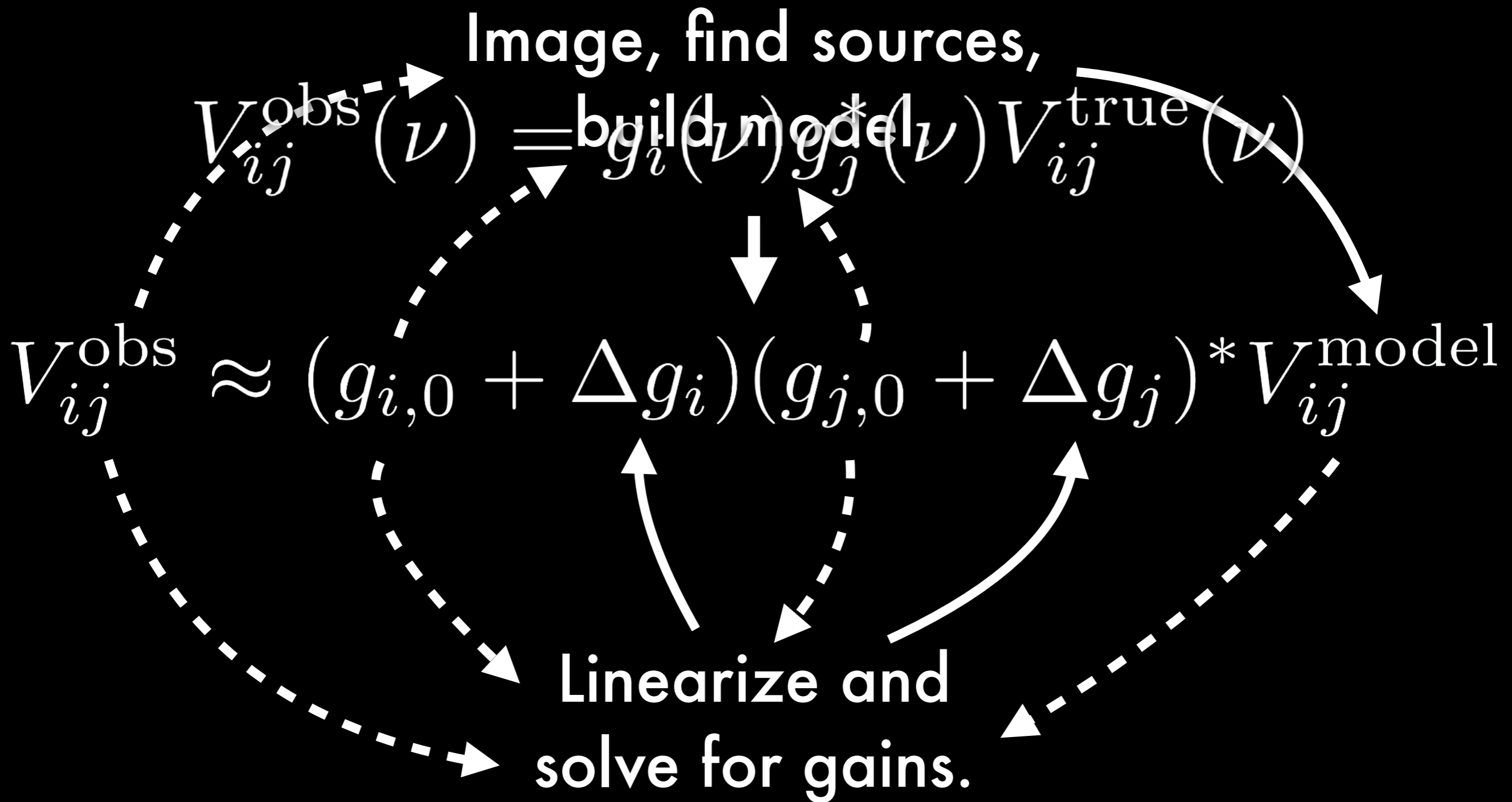
LOFAR relies on precise sky maps and beam models and even then needs some kind of high-pass filtering.

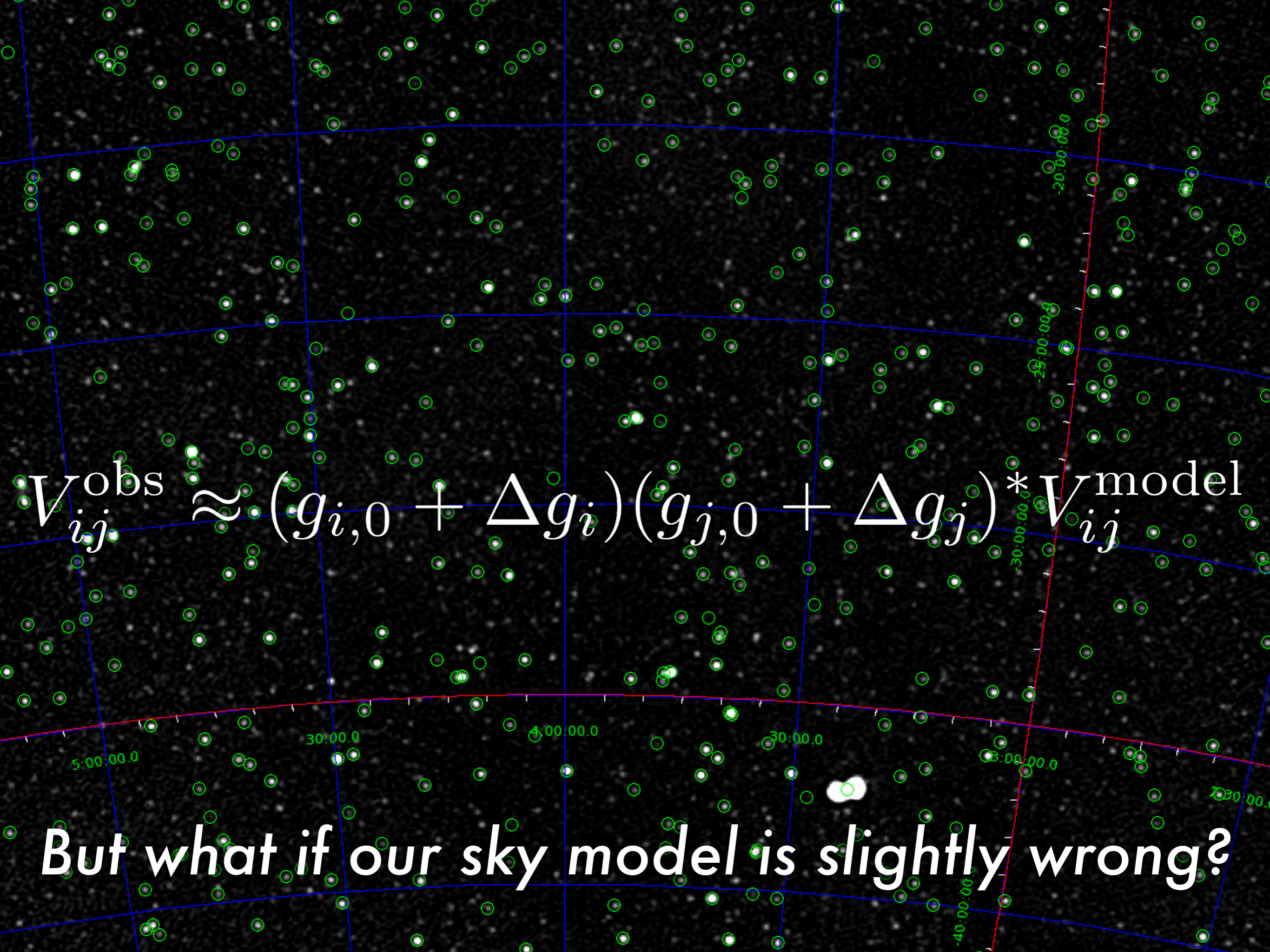
Neither foreground avoidance nor subtraction will work without precision calibration.

$$V_{ij}^{\text{obs}}(\nu) = g_i(\nu)g_j^*(\nu)V_{ij}^{\text{true}}(\nu)$$



The Self-Cal Loop





$$V_{ij}^{\text{obs}} \approx (g_{i,0} + \Delta g_i)(g_{j,0} + \Delta g_j) * V_{ij}^{\text{model}}$$

But what if our sky model is slightly wrong?

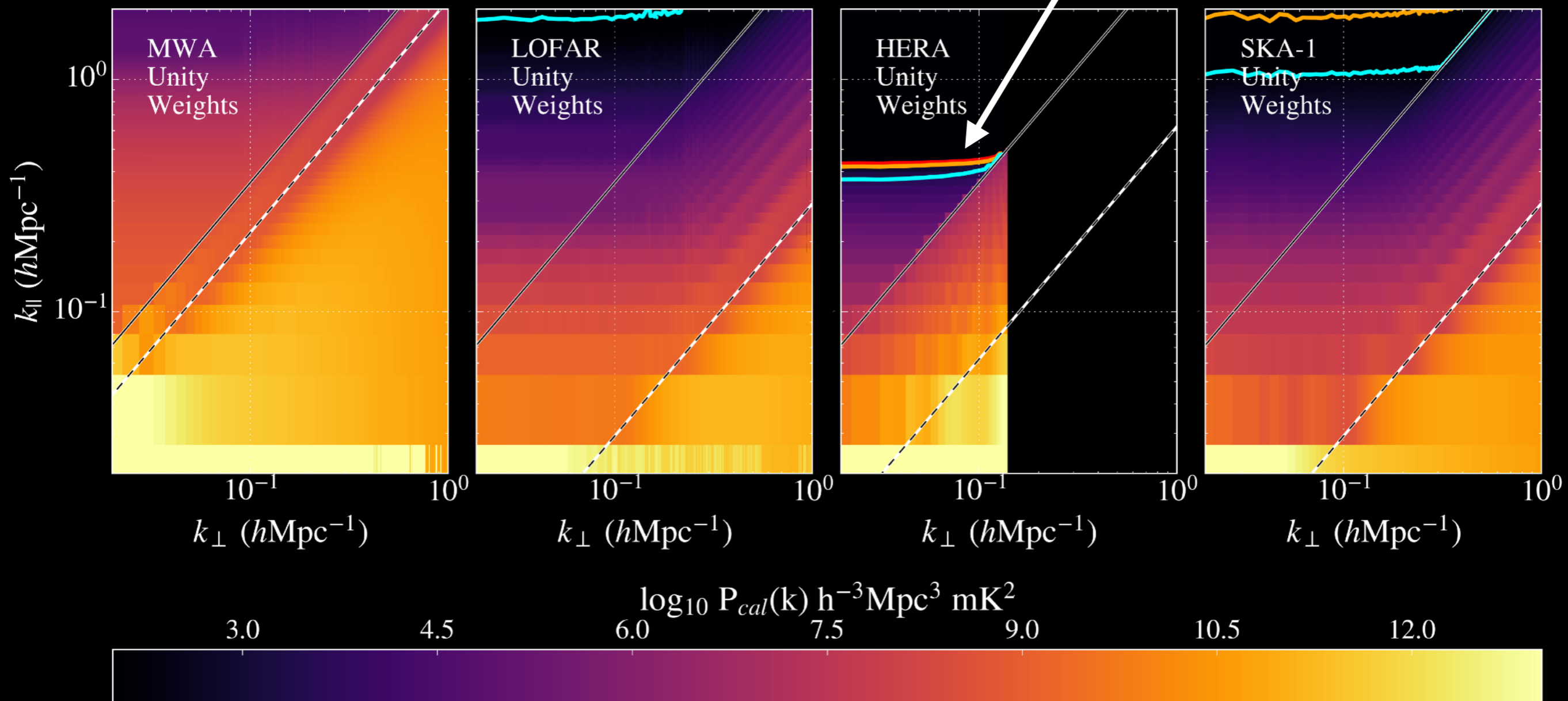
Point sources below the confusion limit

Chromatic errors in $V_{ij}^{\text{model}}(\nu)$

Spectral structure in $g_i(\nu)$

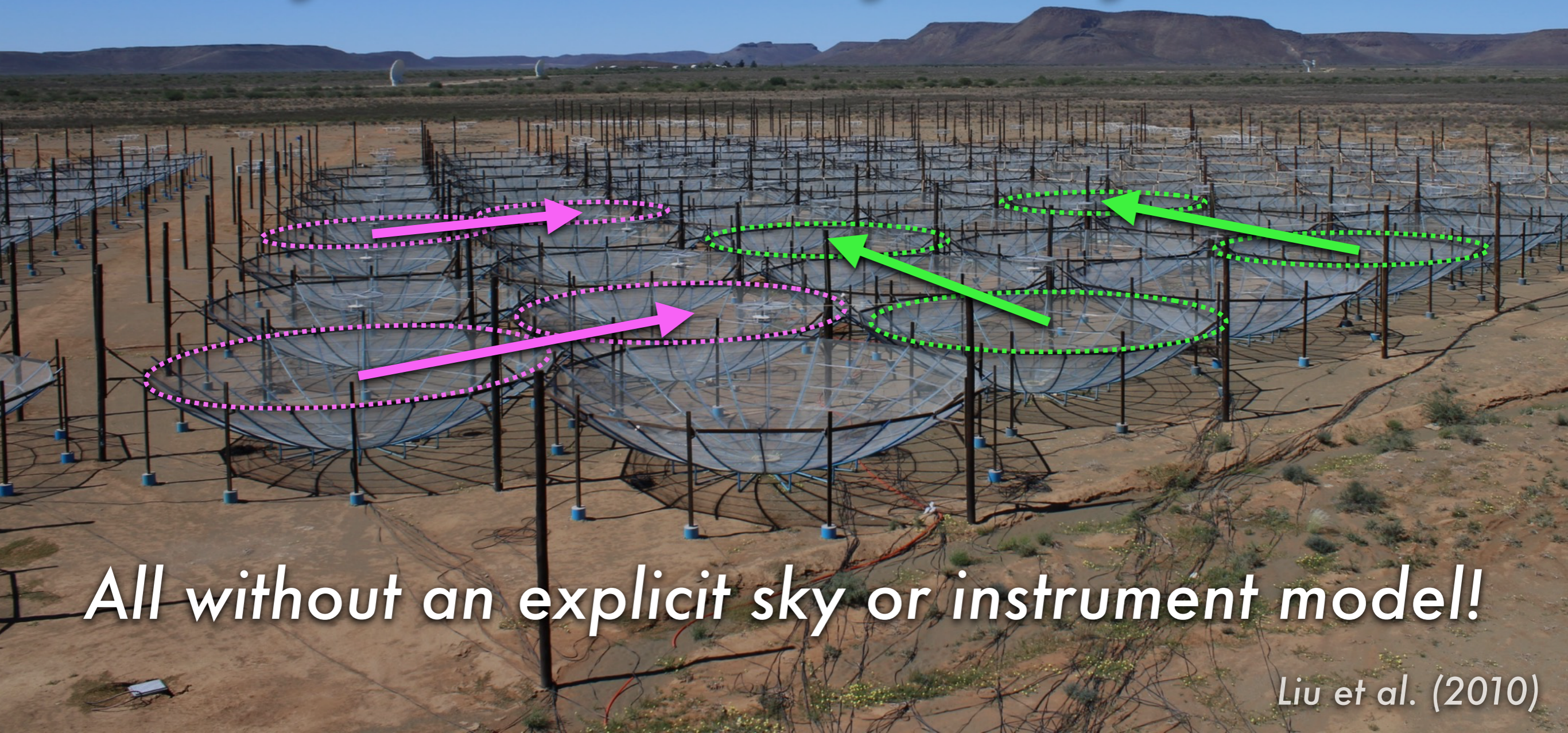
Structure in $g_i(\mathbf{v})$ is set by longest baseline b_{ij} .
Modeling error turns the wedge into a brick.

21 cm Signal = {1, 5, 10} x Modeling Bias



HERA was designed to be calibrated using the internal consistency of redundant baselines.

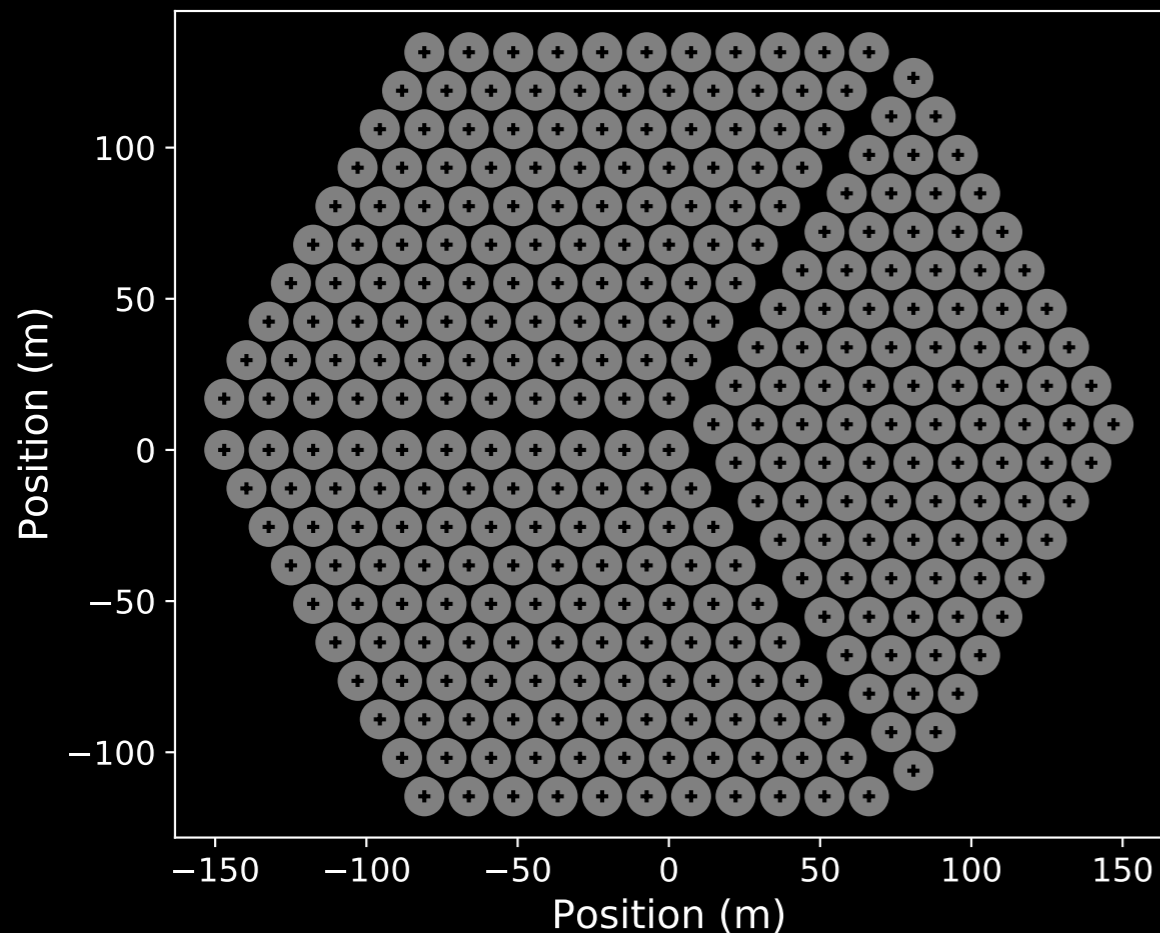
$$V_{ij}^{\text{obs}}(\nu) = g_i(\nu)g_j^*(\nu)V_{ij}^{\text{true}}(\nu)$$



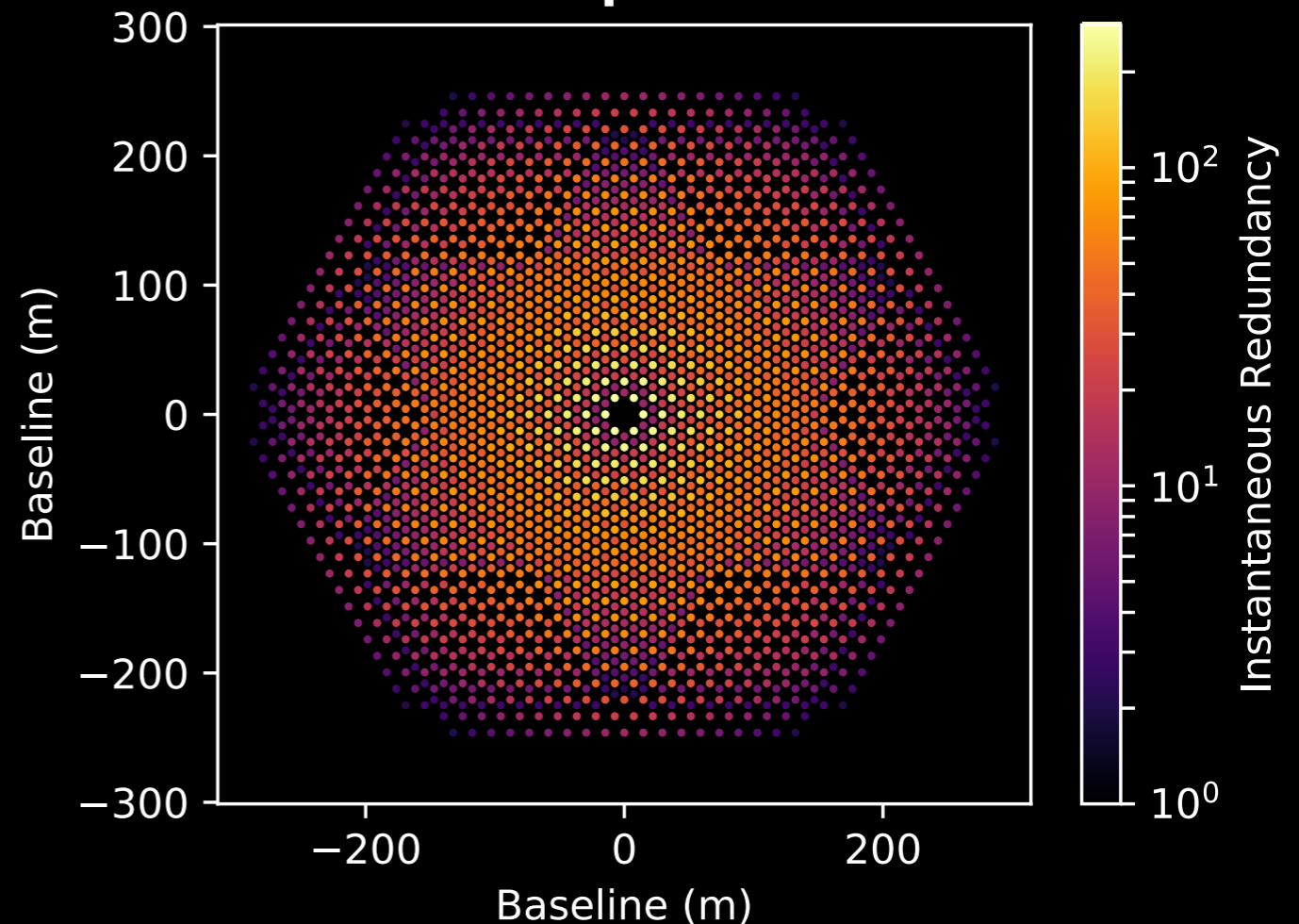
All without an explicit sky or instrument model!

$$V_{ij}^{\text{obs}}(\nu) = g_i(\nu)g_j^*(\nu)V_{ij}^{\text{true}}(\nu)$$

320 Antenna Gains



1,501 Unique Visibilities



51,040 Total Measurements

Goal: Minimize $\chi^2 \equiv \sum \frac{|V_{ij}^{\text{obs}} - g_i g_j^* V_{i-j}^{\text{sol}}|^2}{\sigma_{ij}^2}$

Redundant calibration is no panacea.

CHAMBLISS POSTER

HERA
The Hydrogen Epoch of Reionization Array
Berkeley

The Effect of Antenna Position Errors on Redundant-Baseline Calibration of HERA

Naomi Orosz (UC Berkeley), Dillo (UCB), MZY, ...

ABSTRACT
HERA (the Hydrogen Epoch of Reionization Array) is a large, highly-redundant radio interferometer in the southern hemisphere currently being built out to 350 14-m antennas. Its primary mission is to probe large scale structure in the Epoch of Reionization (EoR) prior to the Epoch of Reionization (EoR) from the hyperfine transition of neutral hydrogen. The array is designed to be calibrated using a set of short baselines of known lengths. However, antenna positions can deviate from their nominal positions by as much as the order of a few centimeters. This paper studies the effect of these foreground contamination in the EoR window in the context of a calibration algorithm that treats groups of redundant baselines as if they were not redundant, but are not due to their true geometry, as if they actually are. Accurate calibration is critical because the foreground contamination is 100,000 times stronger than the EoR signal. We explain the origin of this effect and propose weighting strategies to mitigate it.

INTRODUCTION
The Epoch of Reionization Era
Cosmic Dawn
occurred between $z=6$ and $z=50$
HERA observes $z=5-25$ but focuses on $z=10-12$ (EoR)

METHODS
Measuring and Calibrating Visibilities
Radio telescopes measure a "complex visibility" rather than just a flux/intensity
True visibility (calculated with source and BL vectors)
Observed visibility depends on antenna gains
 $V_{ij}^{obs}(\nu) = g_i(\nu)g_j^*(\nu)V_{ij}^{true}(\nu)$

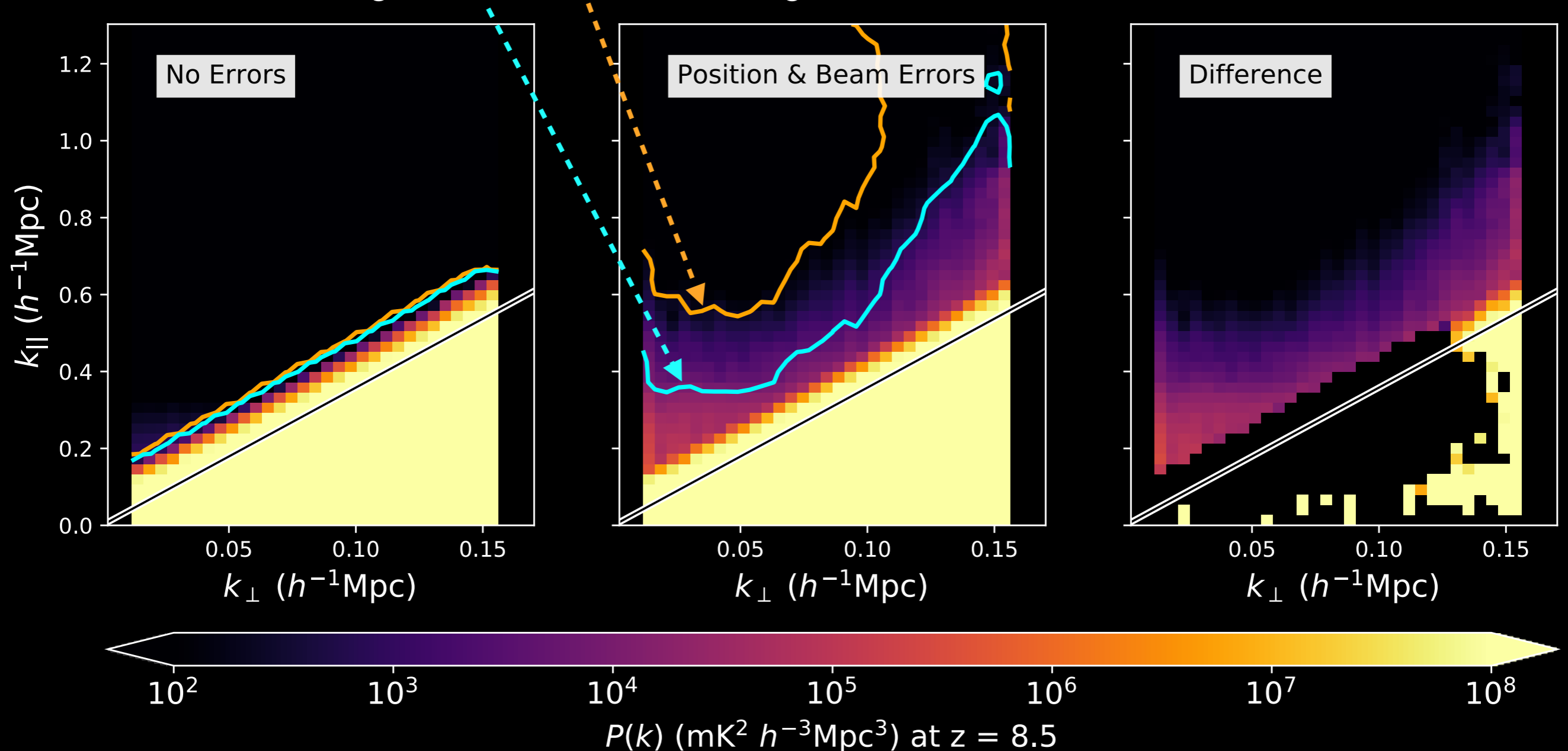
Redundant Baseline Calibration
True visibilities are calculated based on the idealized, unique baselines
Redundant baselines have the same length and orientation
Having large groups of redundant baselines makes calibration more precise

SIMULATIONS
We simulate visibilities from 100-200 MHz using bright radio point sources from the MWA GLEAM survey. We give the antennae normally-distributed position errors with varying size scales up to 1% of the shortest baseline. Then we produce power spectra for simulated arrays with various sizes, separations, and beam properties.

Naomi Orosz
Former UCB
Undergraduate

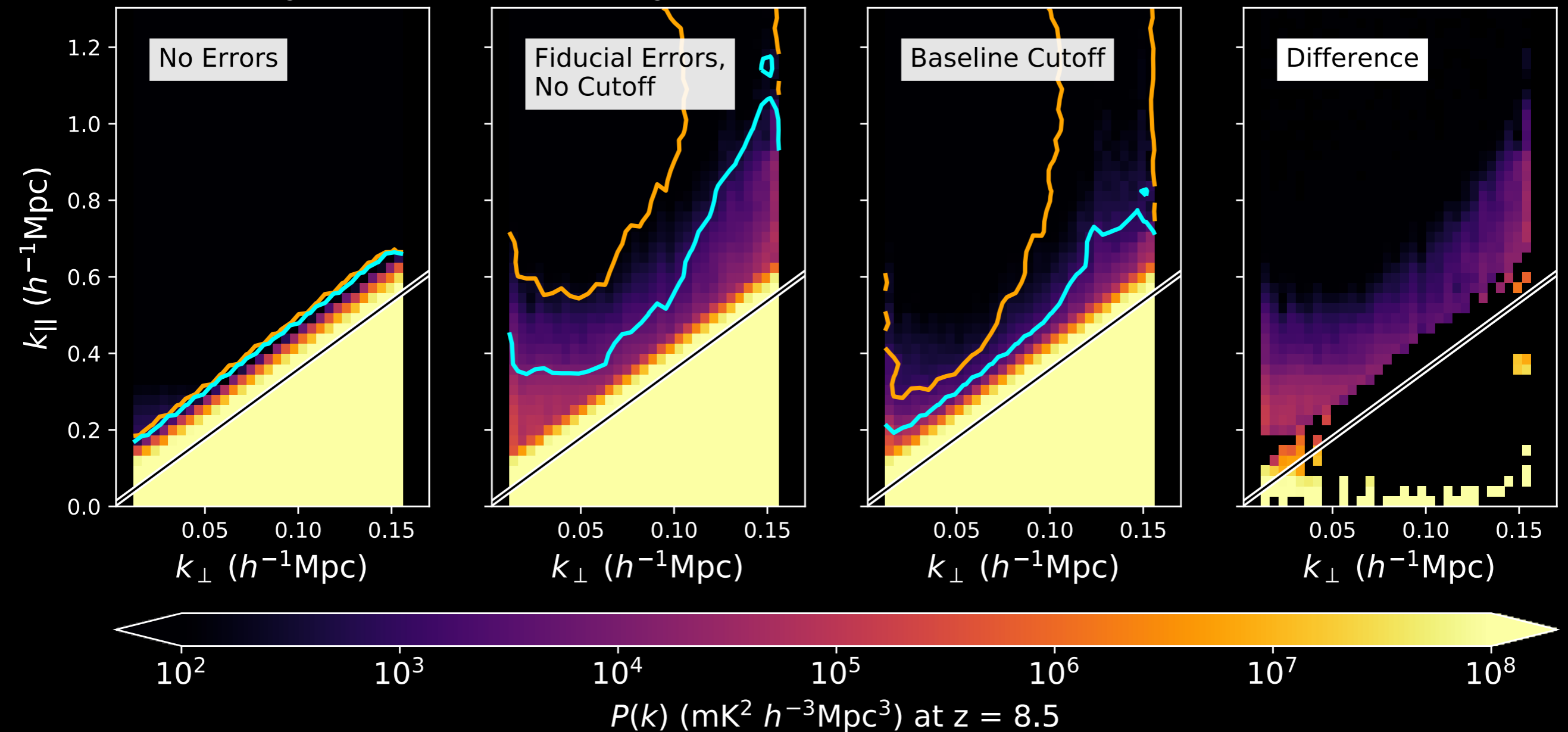
Non-redundancy can contaminate the same region of Fourier space.

21 cm Signal = 1x or 10x Foregrounds



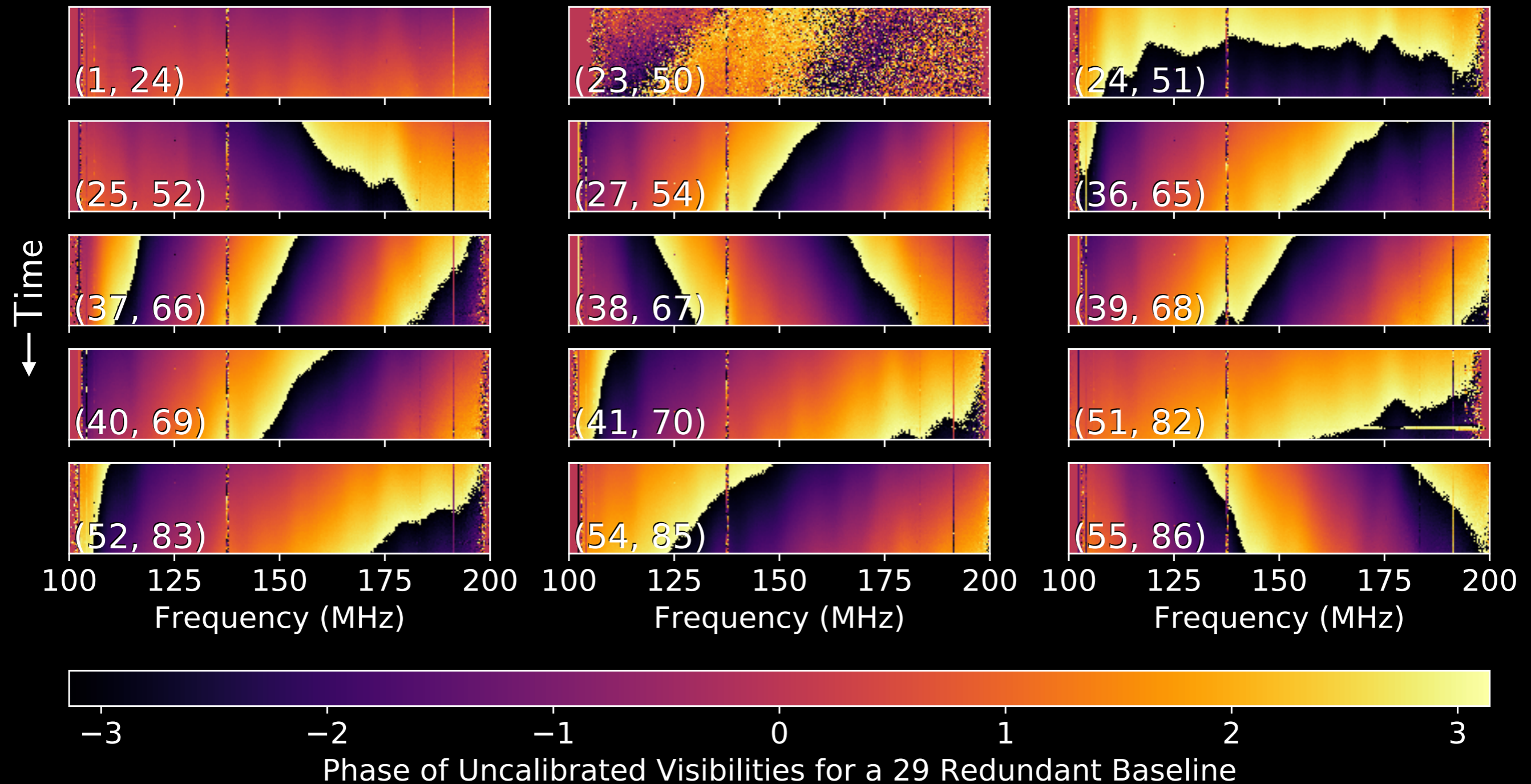
Being more careful—e.g. by calibrating without the longest baselines—gets us back most of our EoR window!

21 cm Signal = 1x or 10x Foregrounds

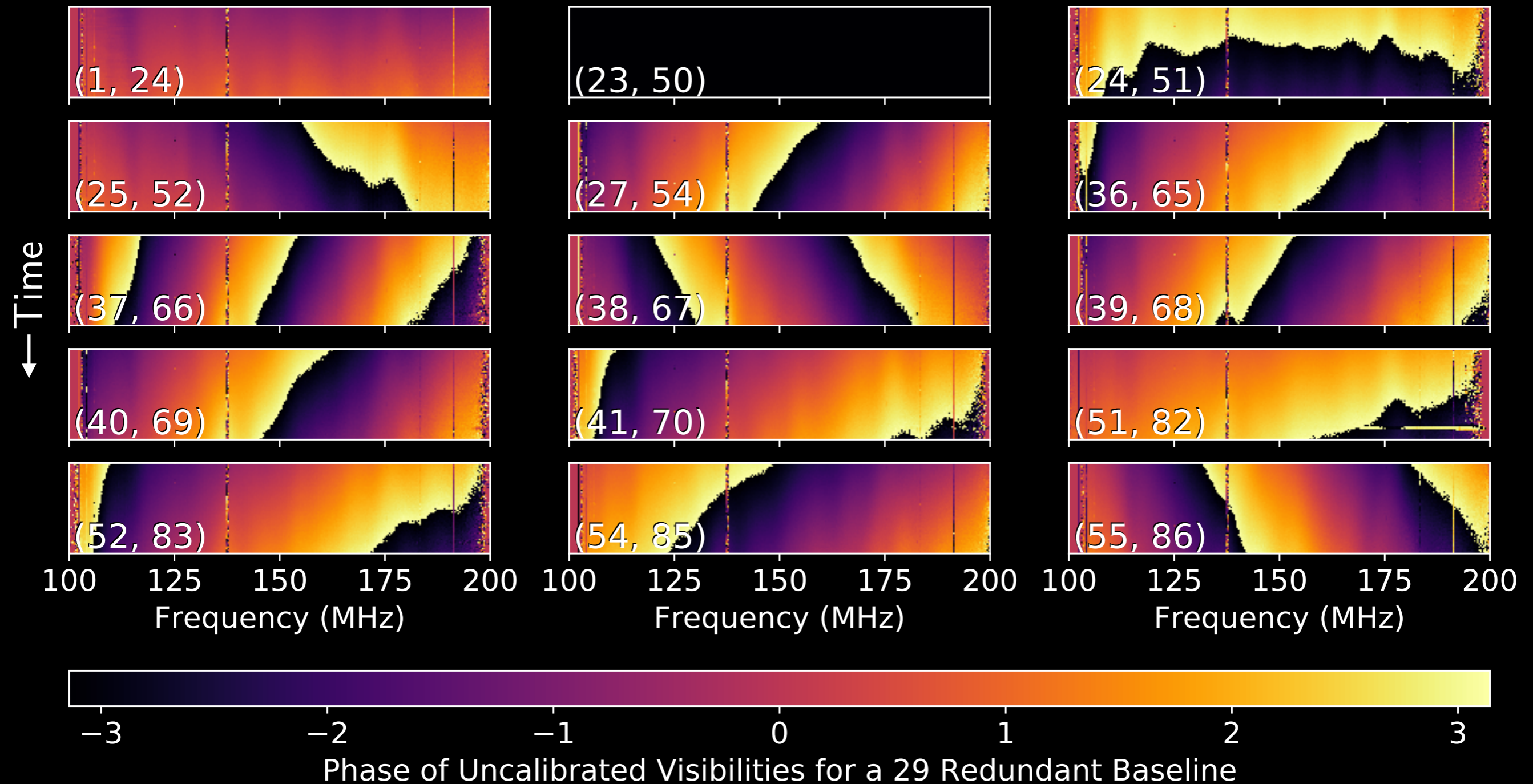


**Redundant calibration
is working well so far.**

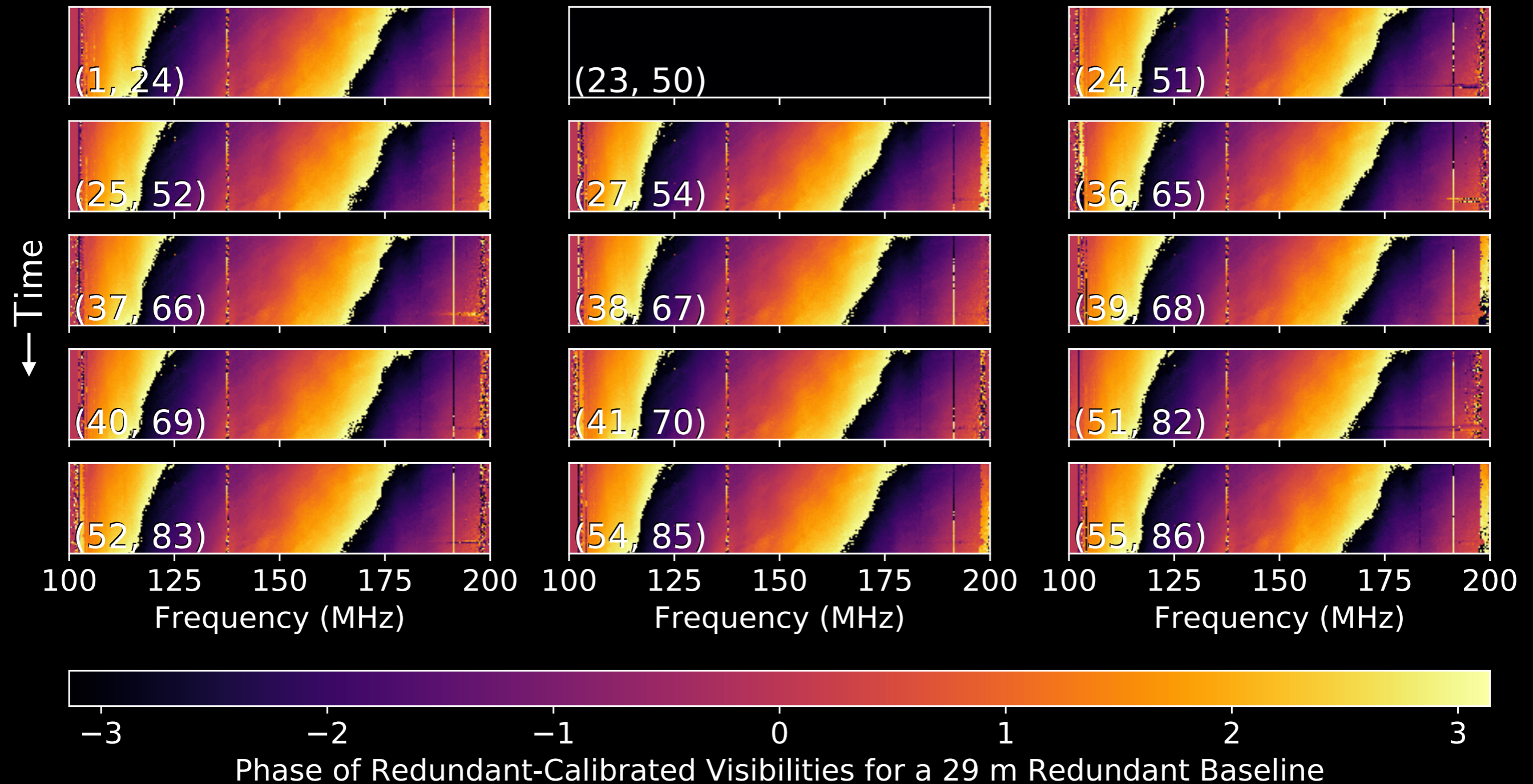
Example raw HERA data for a single redundant baseline group.



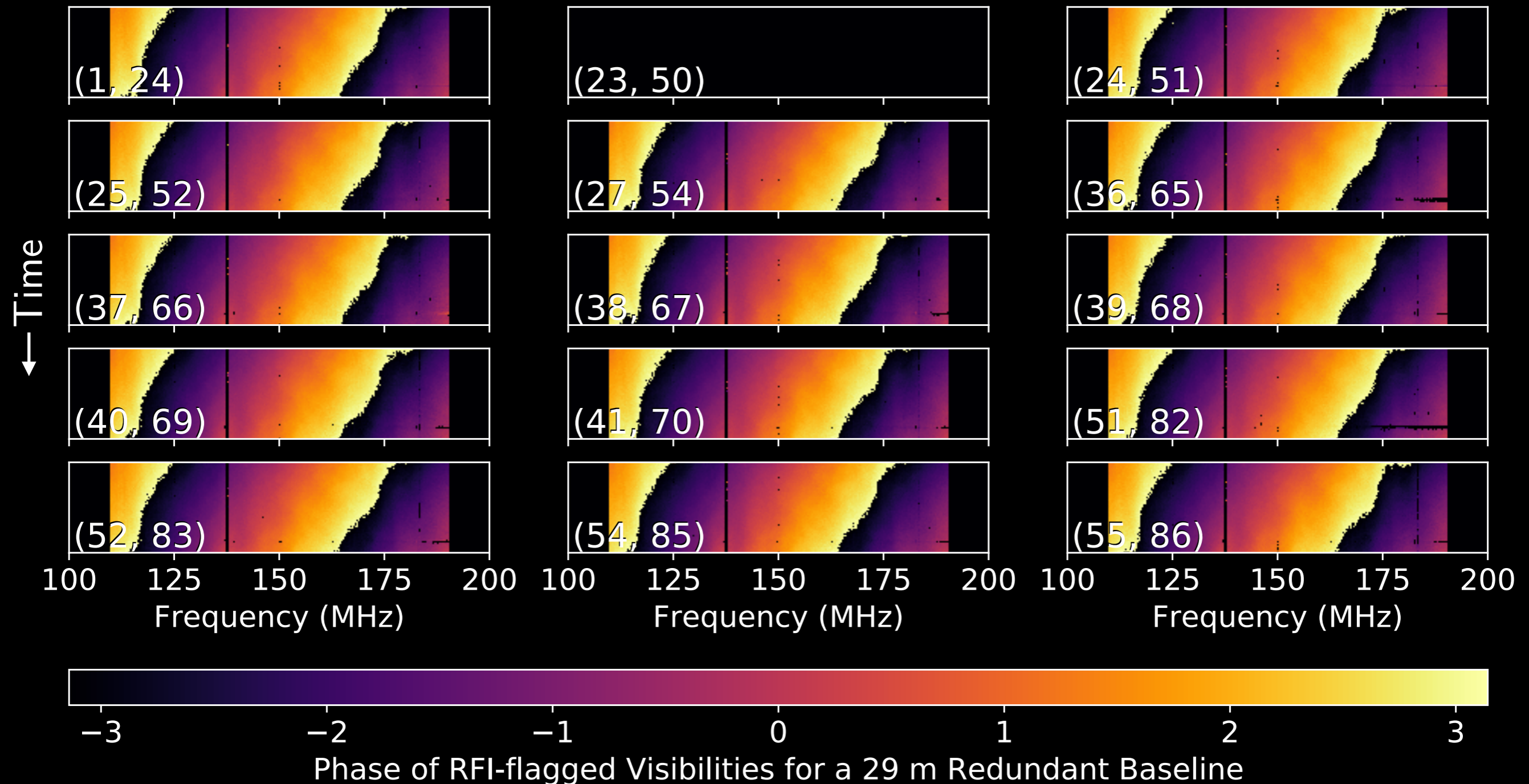
First we flag bad antennas.



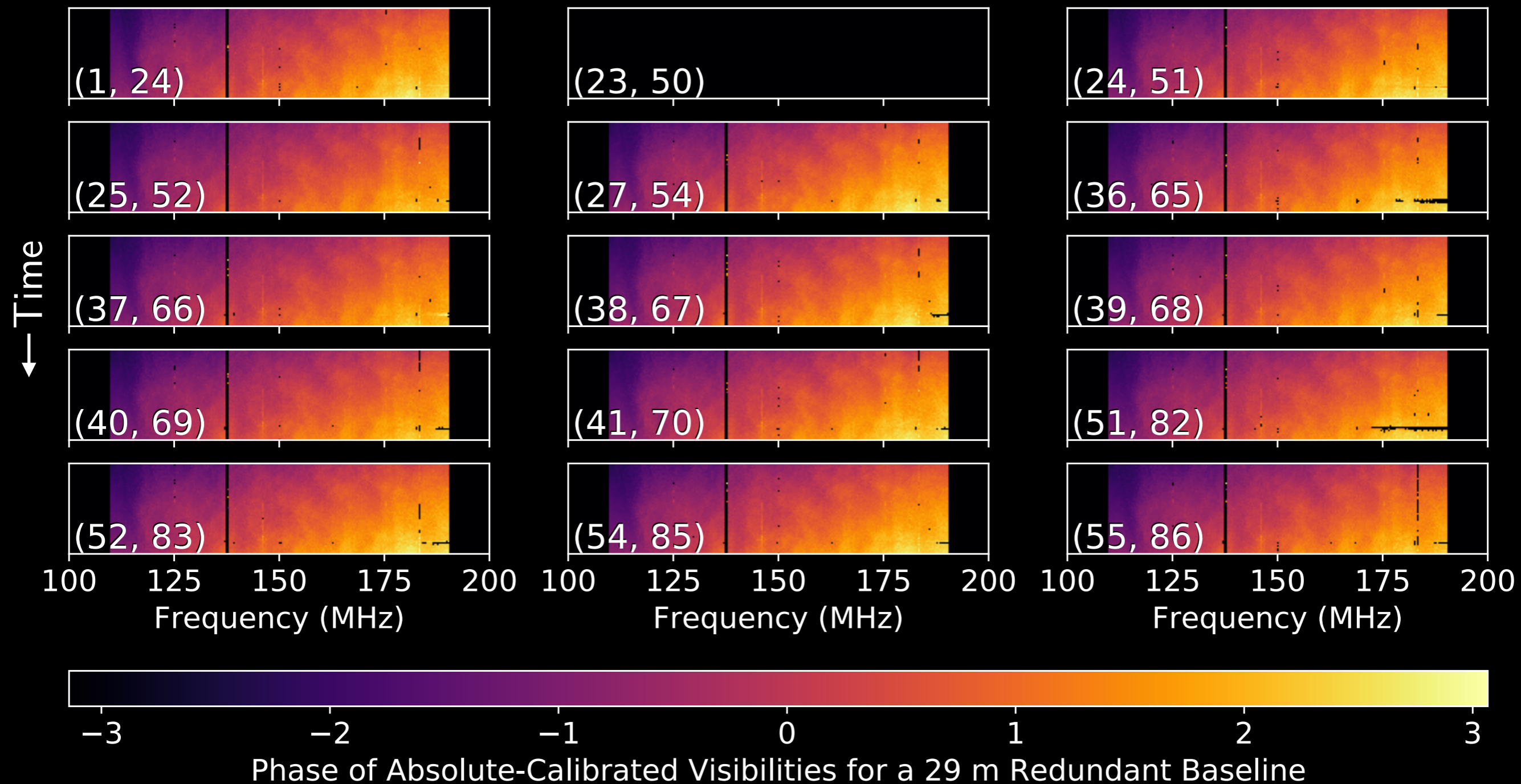
Next we impose the redundancy constraint to solve for all gains.



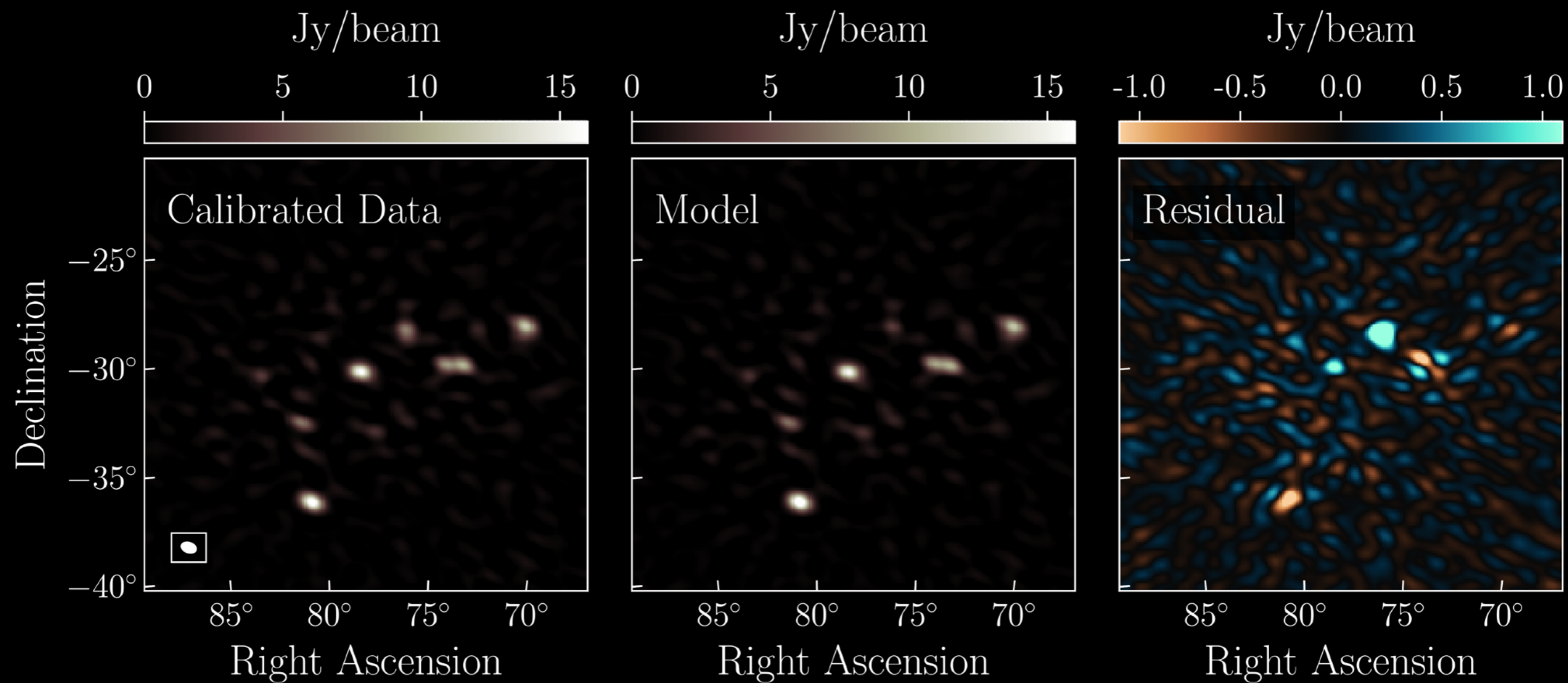
Then we mask-out band edges and radio-frequency interference.



Finally we fix to an absolute sky-reference.

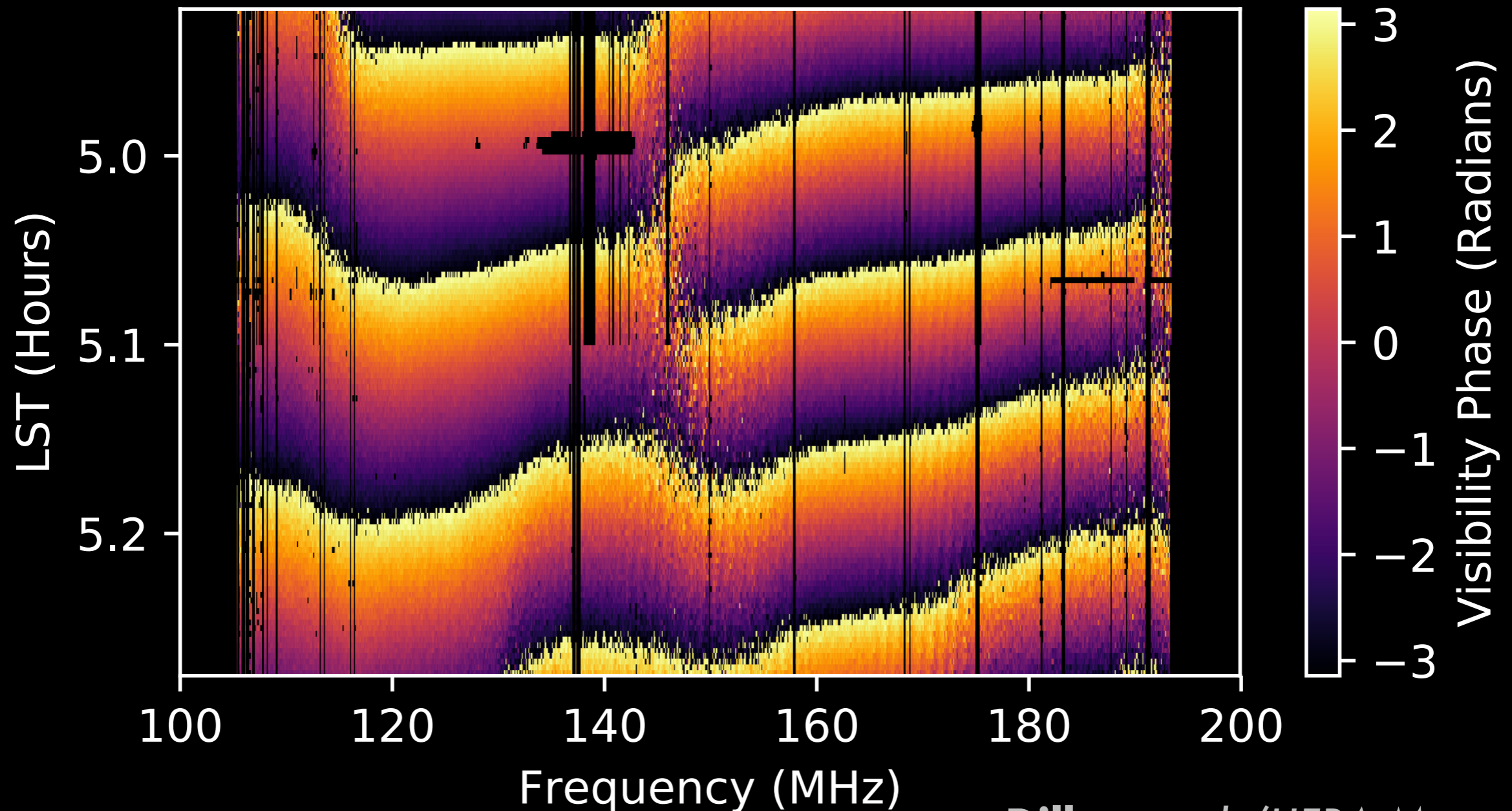


Finally we fix to an absolute sky-reference.



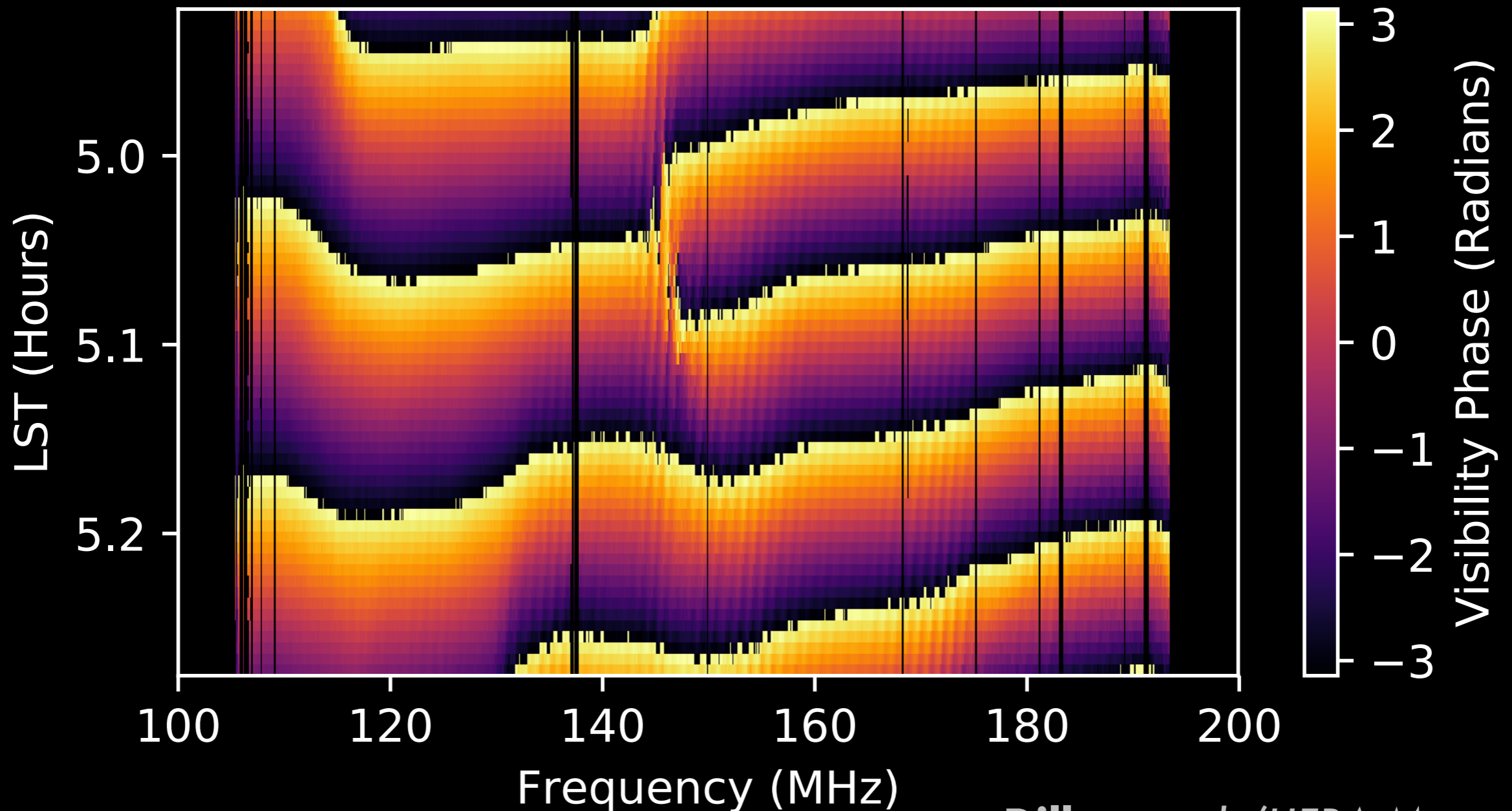
The instrument looks stable from day to day...

(65, 71) on 2458098



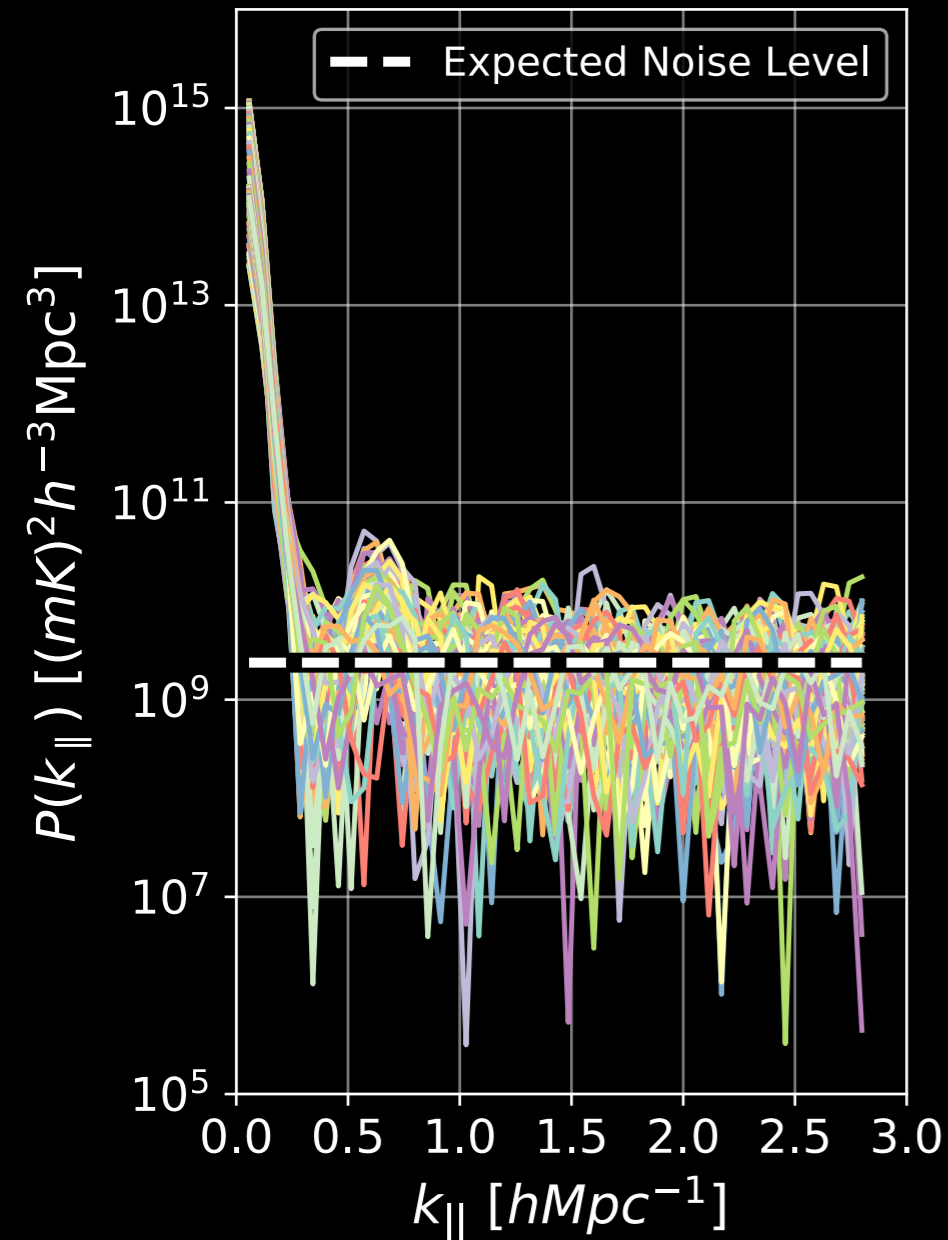
So we can keep integrating
down to maximize sensitivity.

(65, 71) LST-Binned

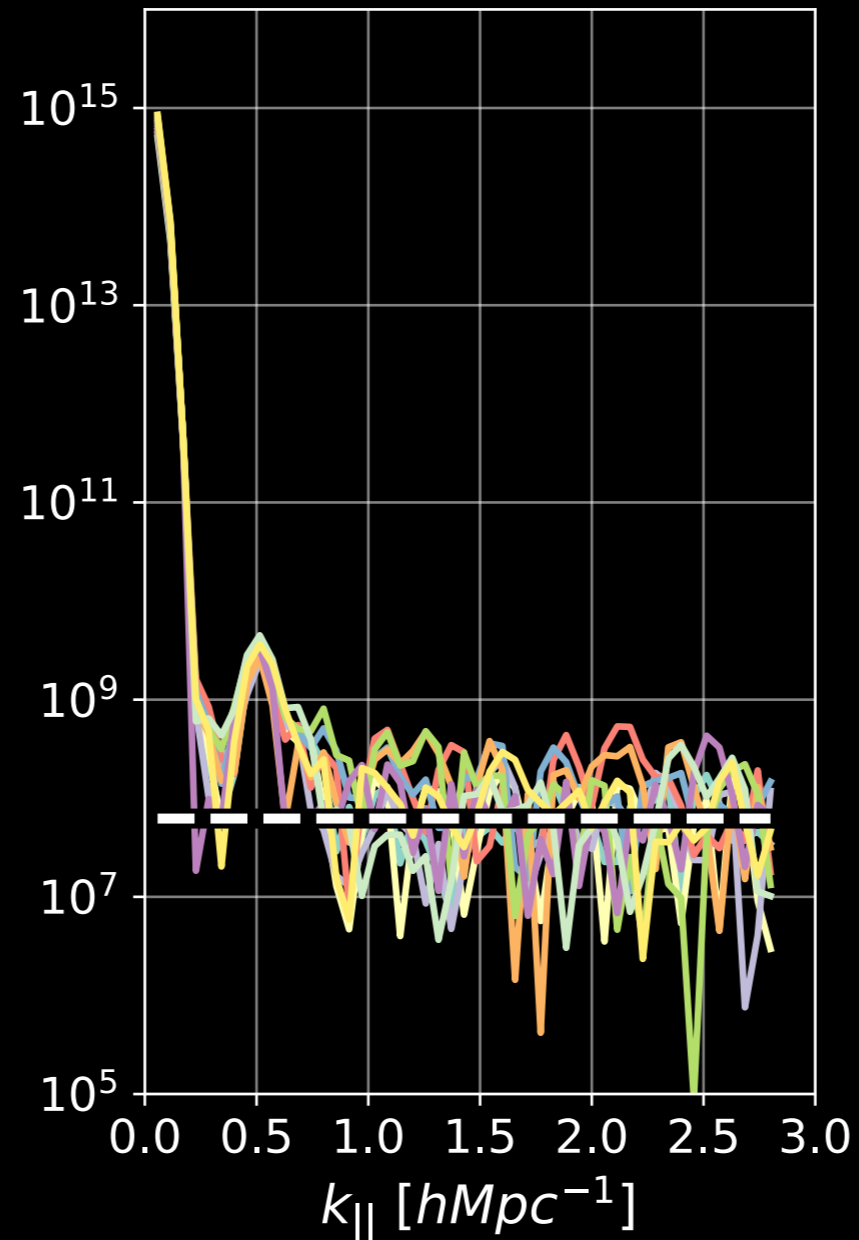


And start forming power spectra.

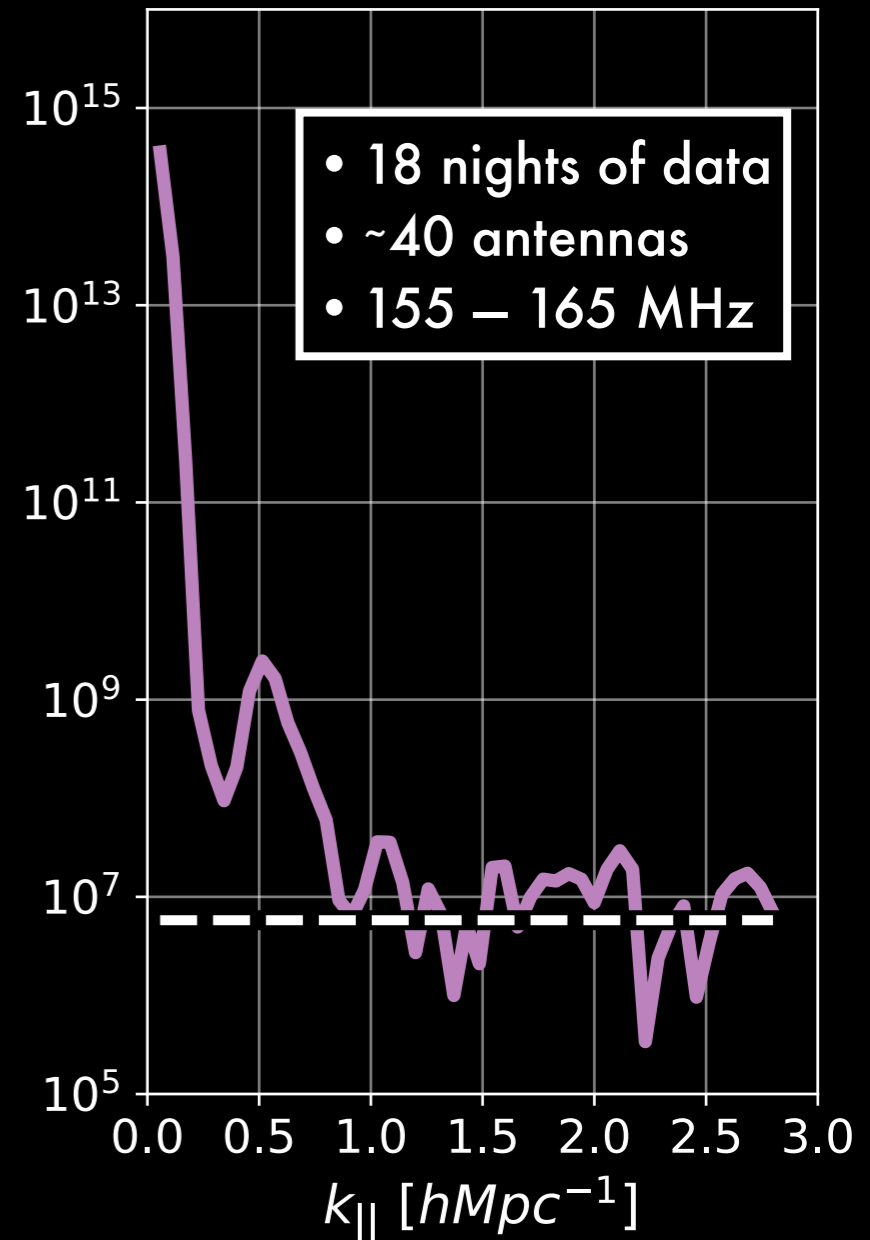
Individual Power Spectra
(Each Equivalent to ~ 7 Minutes)



Redundantly-Averaged
(Each Equivalent to ~ 265 Minutes)

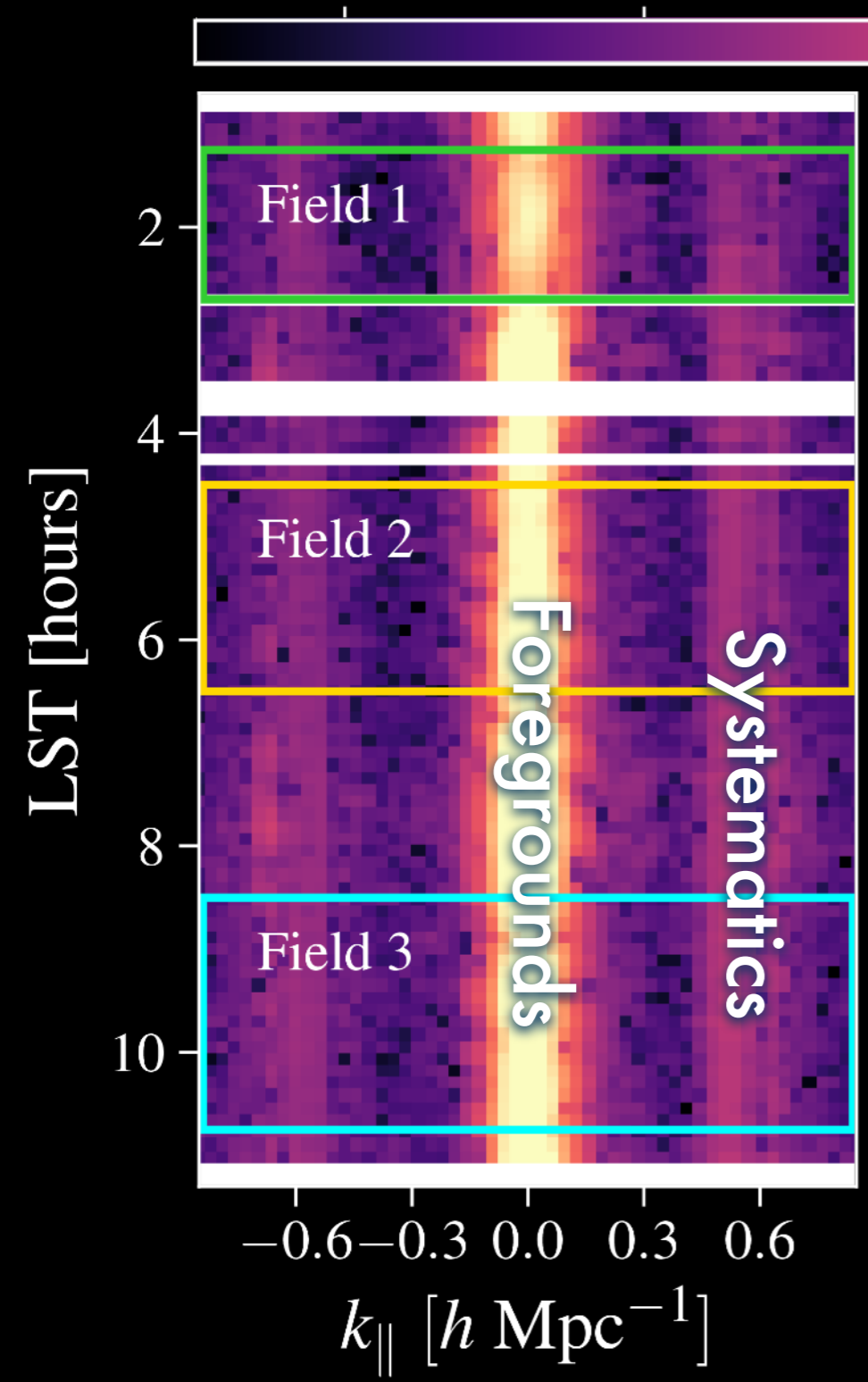


Time- and Redundantly-Averaged
(Equivalent to ~ 2870 Minutes)



$\log_{10} P(k_{\parallel}) [\text{mK}^2 h^{-3} \text{Mpc}^3]$

6 8 10 12 14

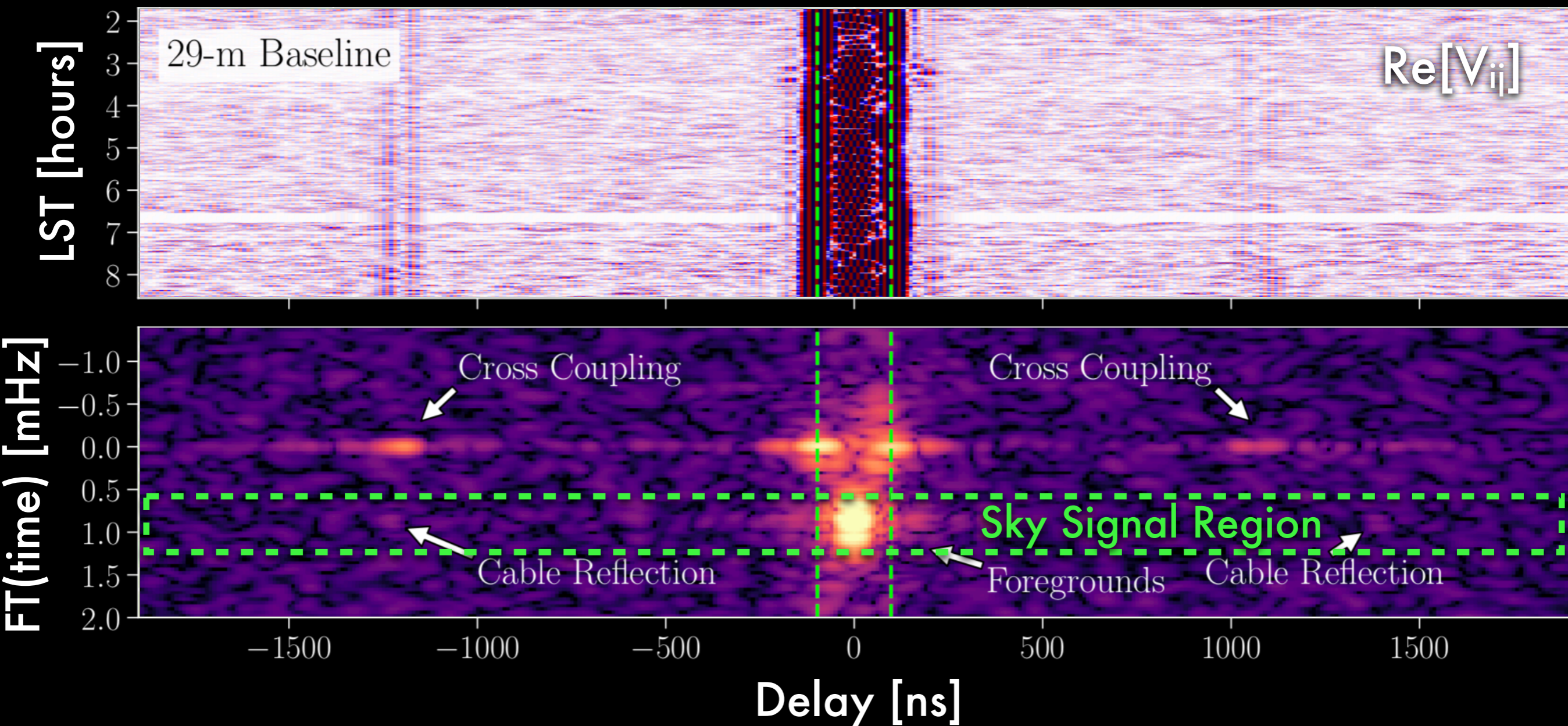


And as soon as we Fourier transform our data, we run into a problem: high delay (k_{\parallel}) systematics on every baseline!

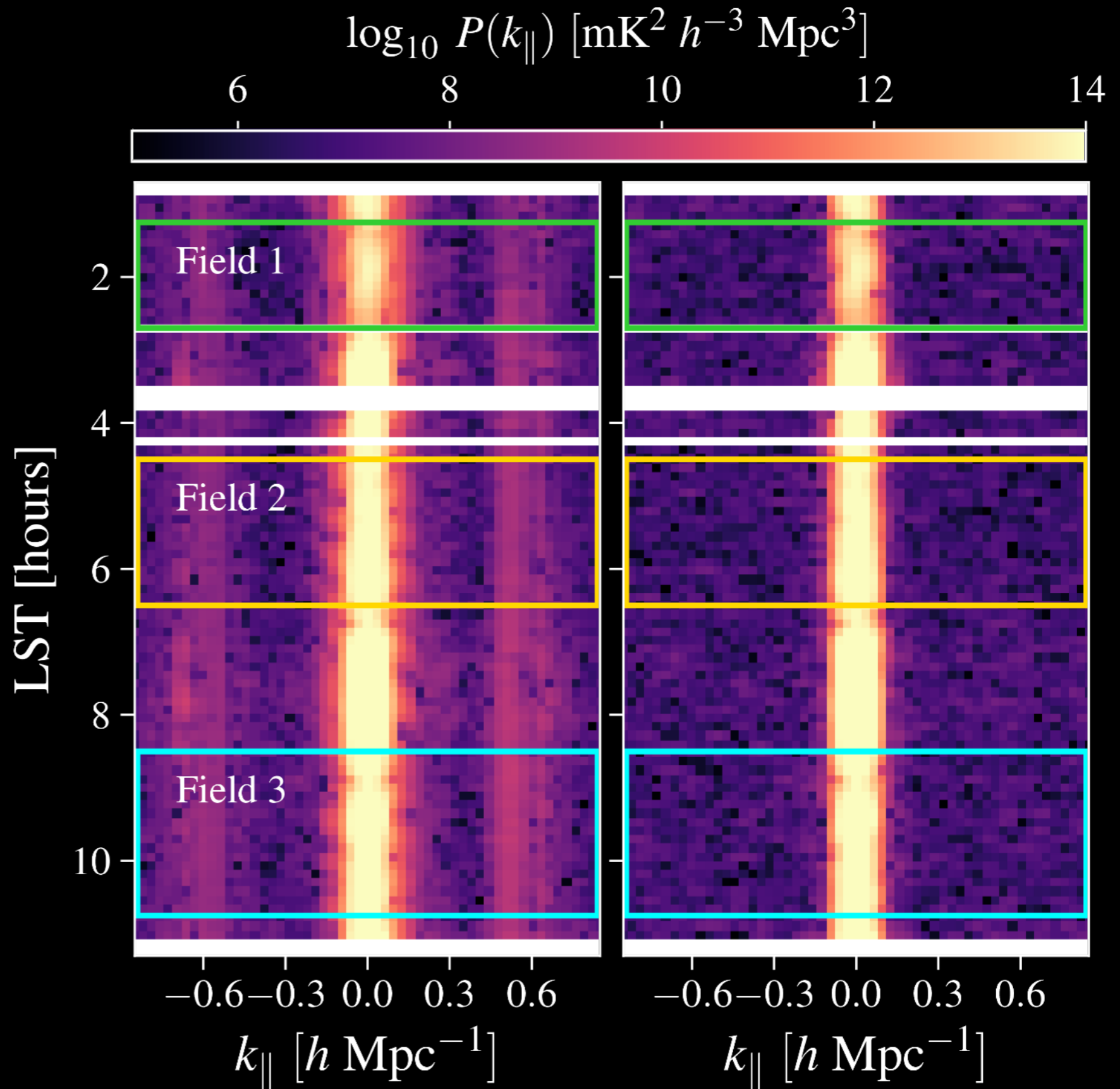


Nick Kern
Former UCB
Grad Student
(Now at MIT)

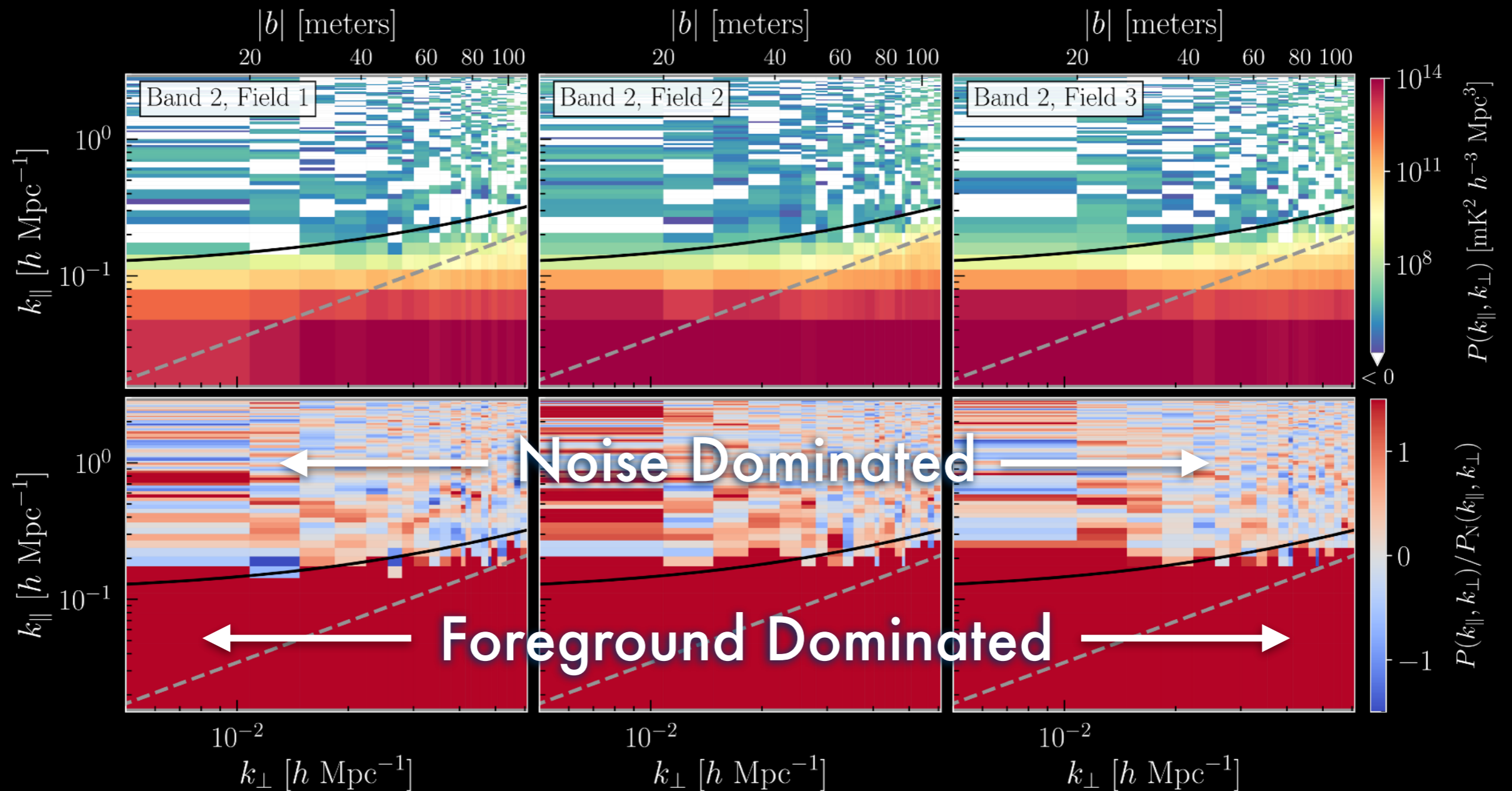
To understand this effect, we have to examine the temporal structure of the foregrounds and the systematics—how fast they “fringe.”



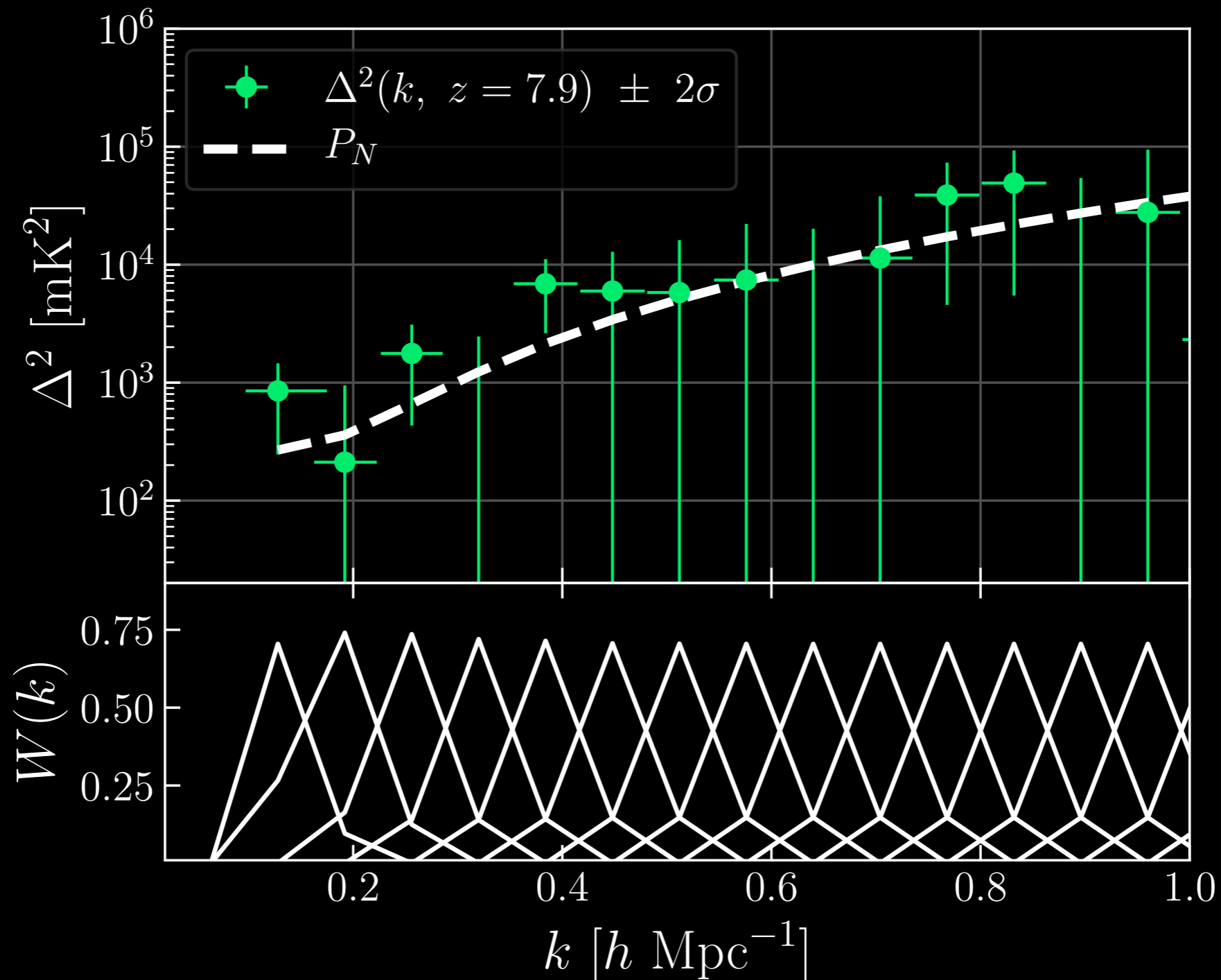
With our techniques for relatively lossless systematics removal, we're getting very close to the thermal noise limit.



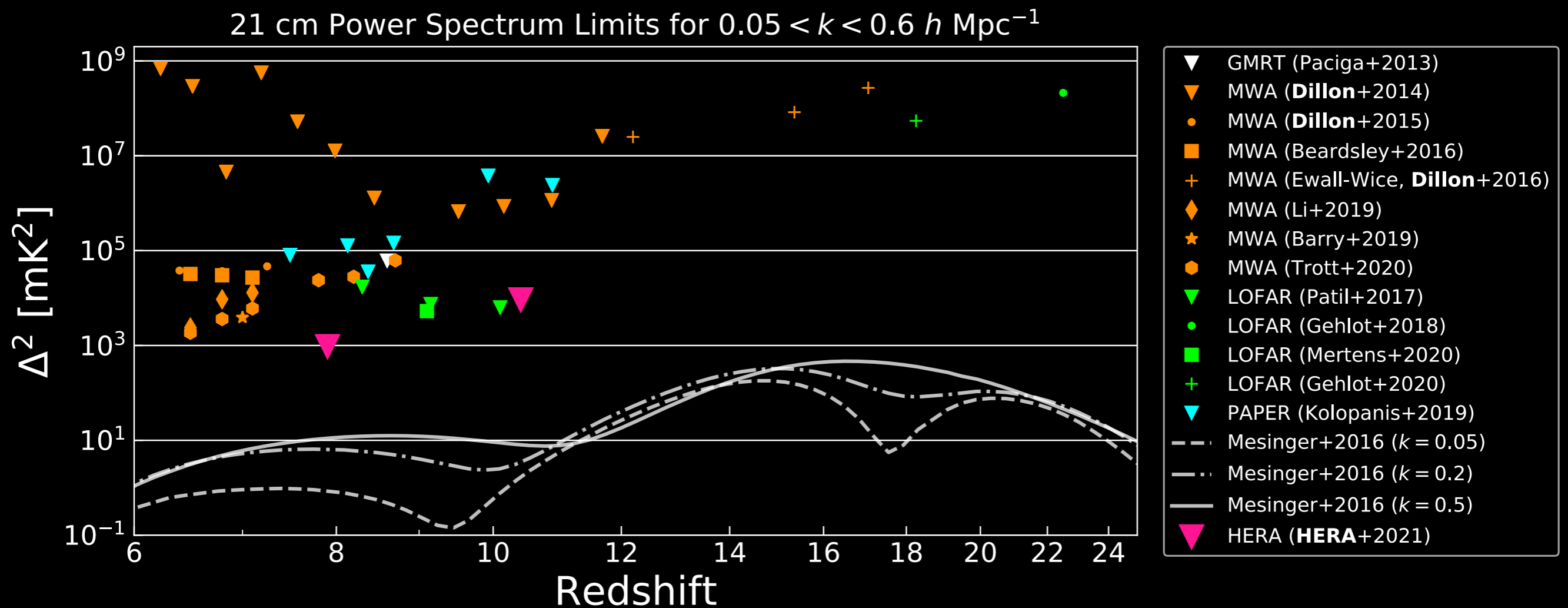
With high-delay systematics mitigated, we can finally form our 2D power spectra.



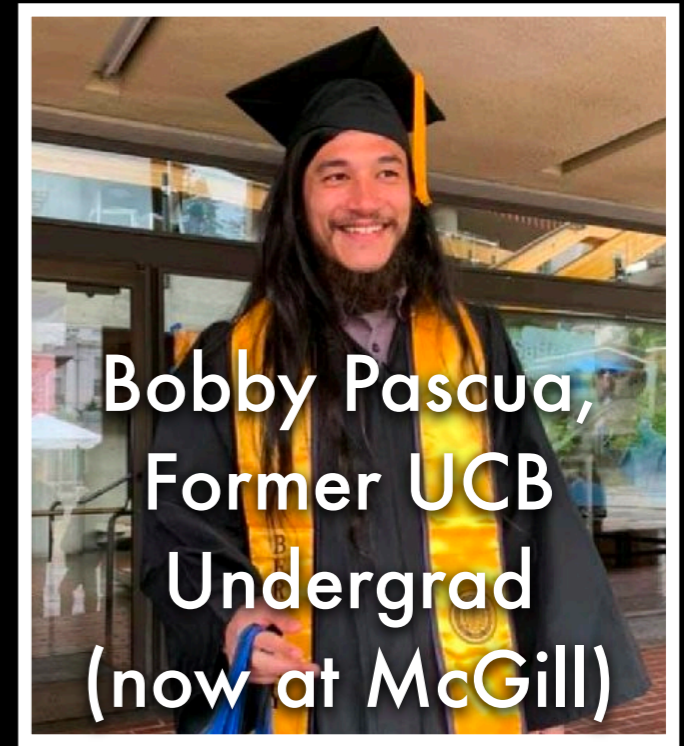
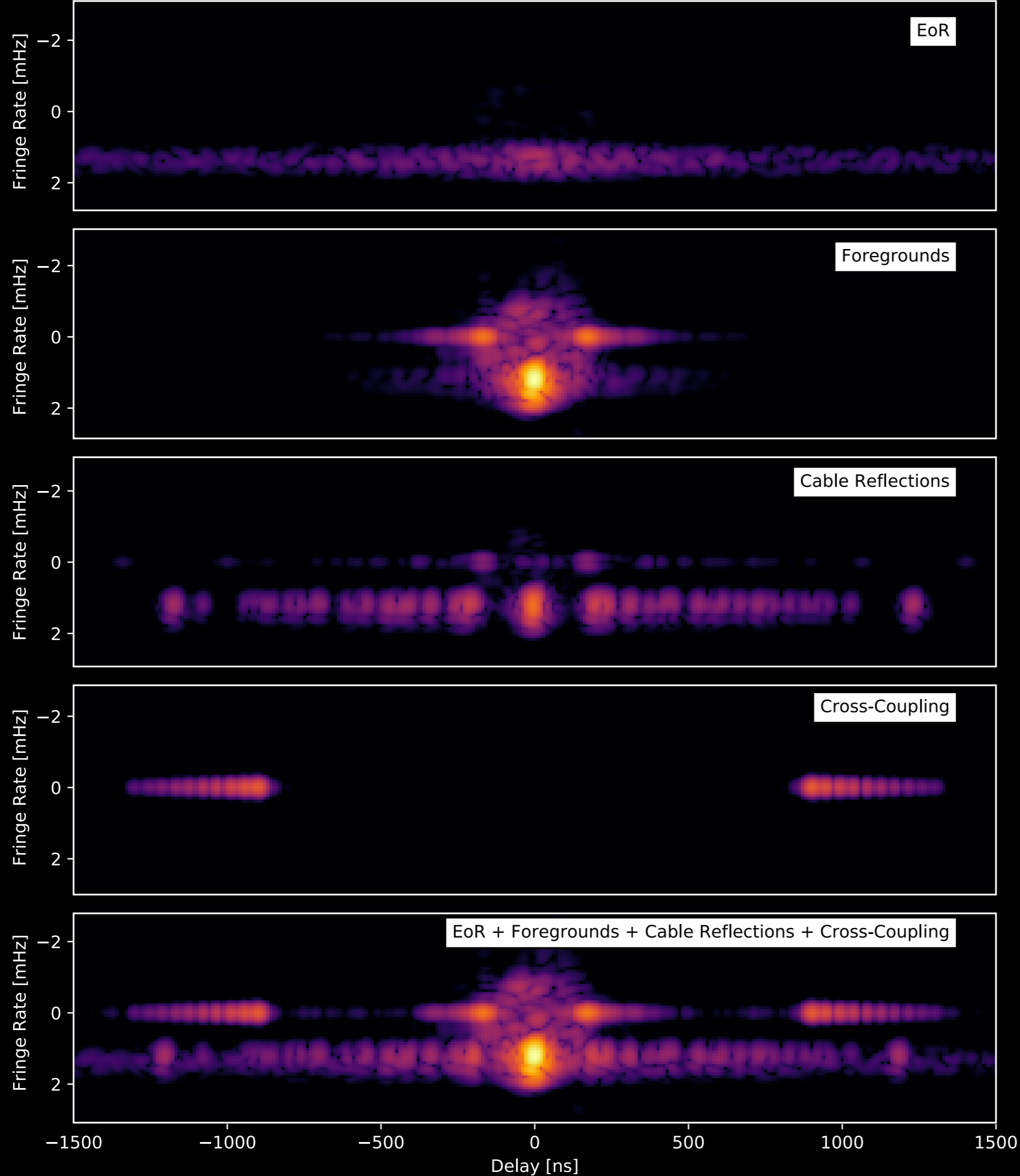
Working outside the wedge, we get our power spectrum upper limit.



Our first (and world-leading!) limit with only 18 nights and just foreground-avoidance.

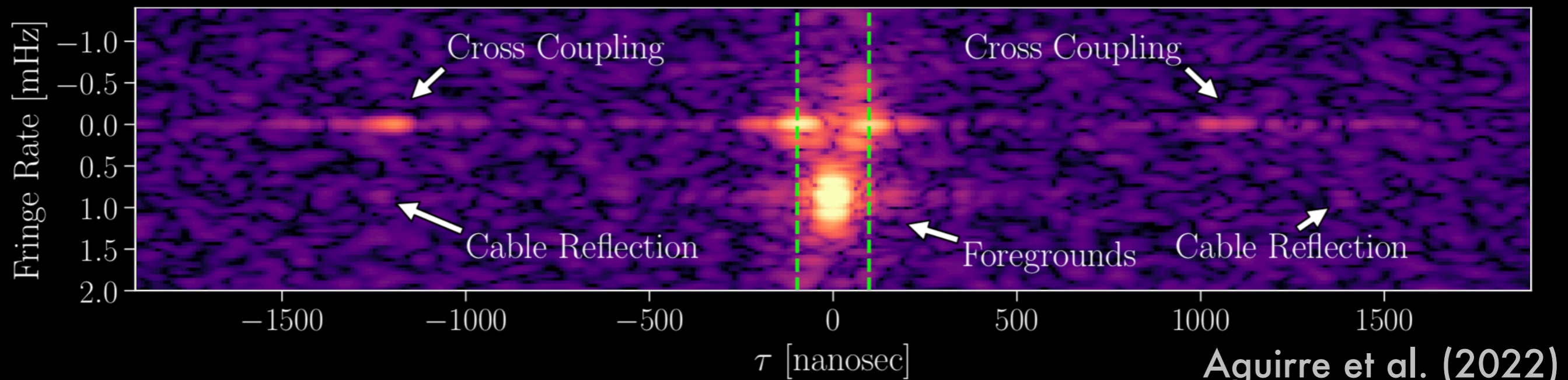
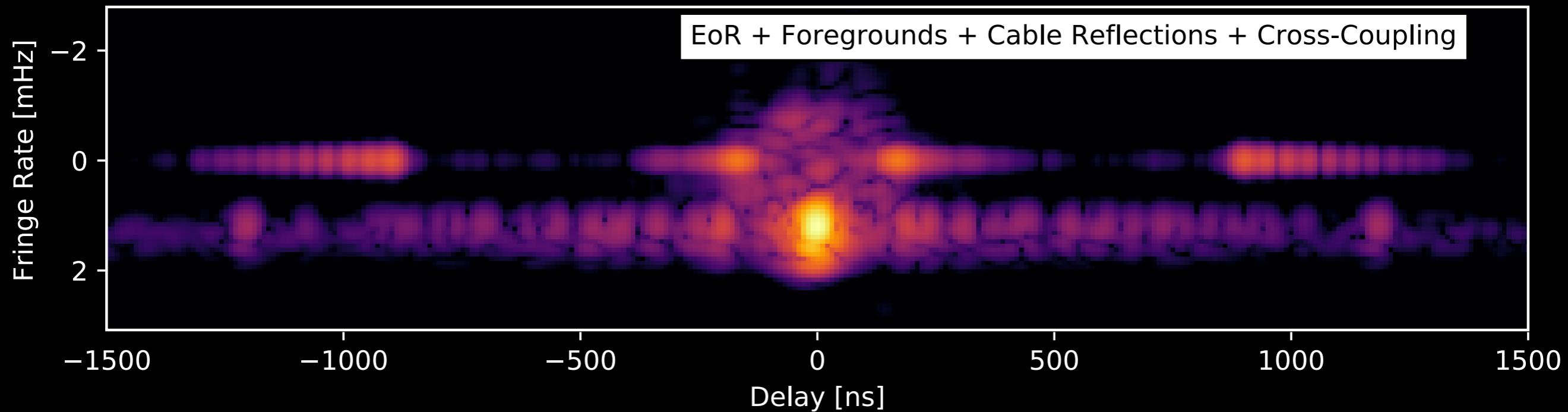


**How are we building
confidence in our results?**



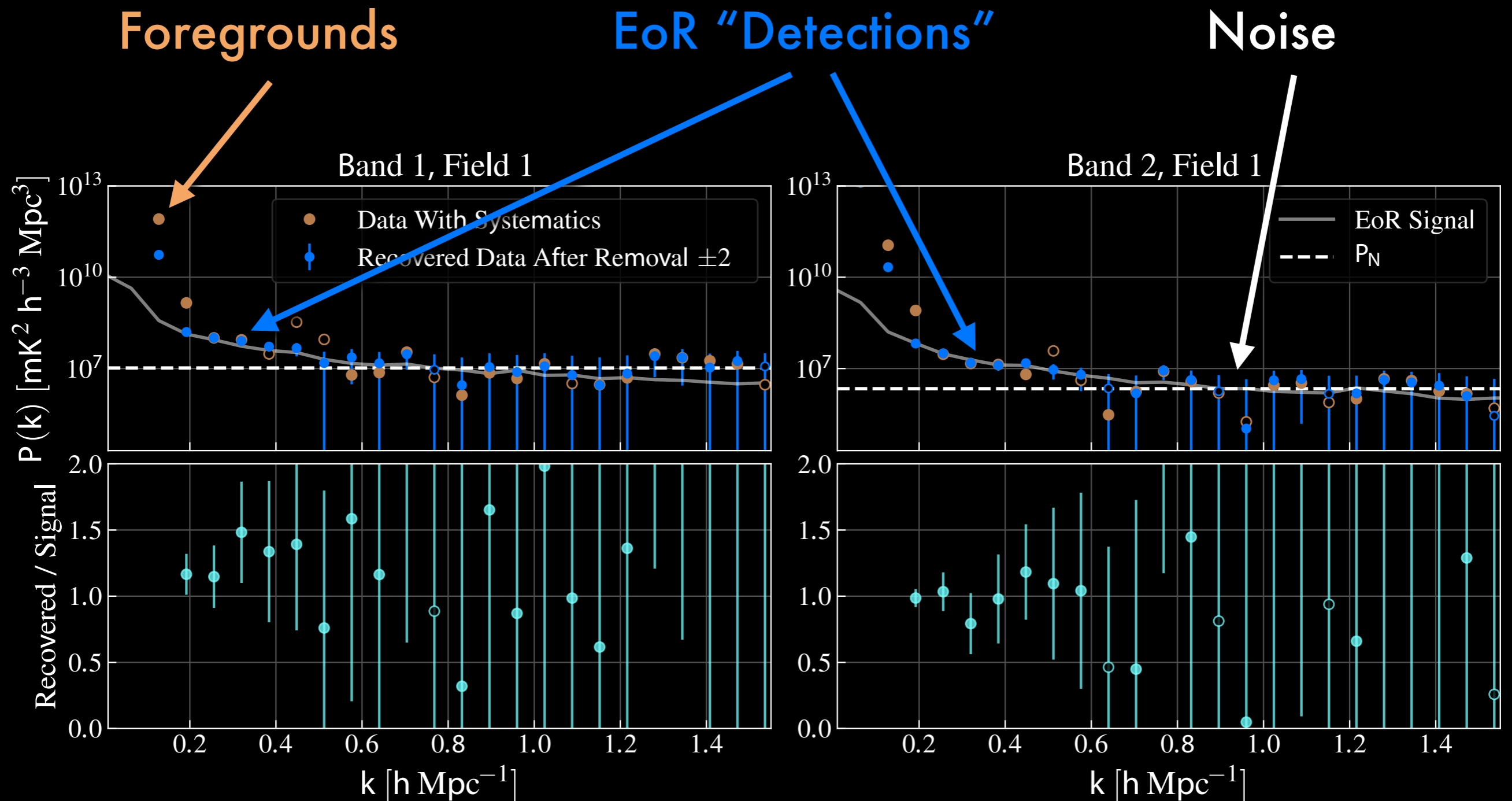
We built end-to-end tests of analysis pipeline with simulated EoR, foregrounds, and systematics.

The simulation is really starting to reflect the complexity of real data.

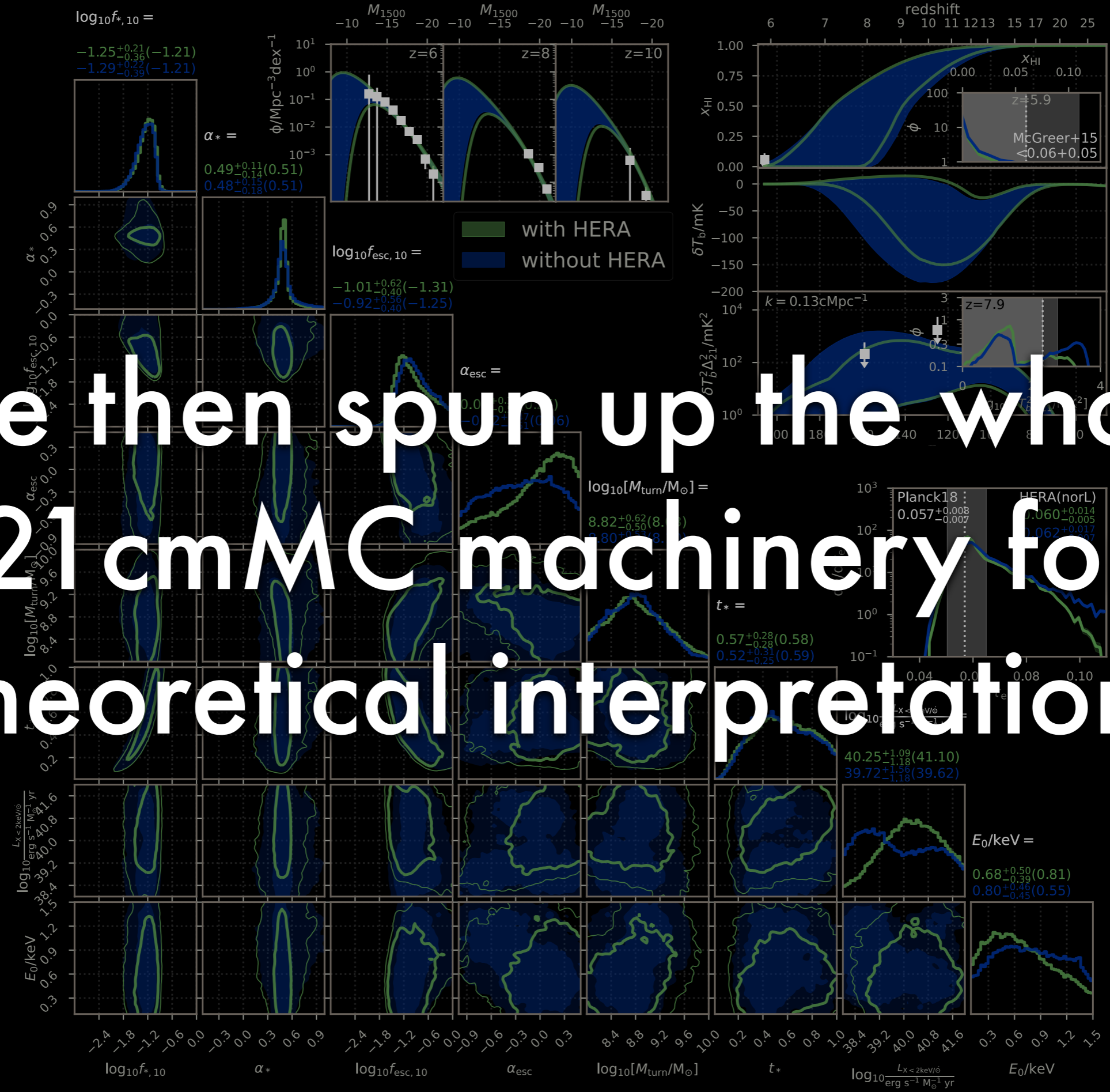


Aguirre et al. (2022)

We're able to extract a simulated signal and quantify our biases, which raised our limits by $\sim 10\%$.

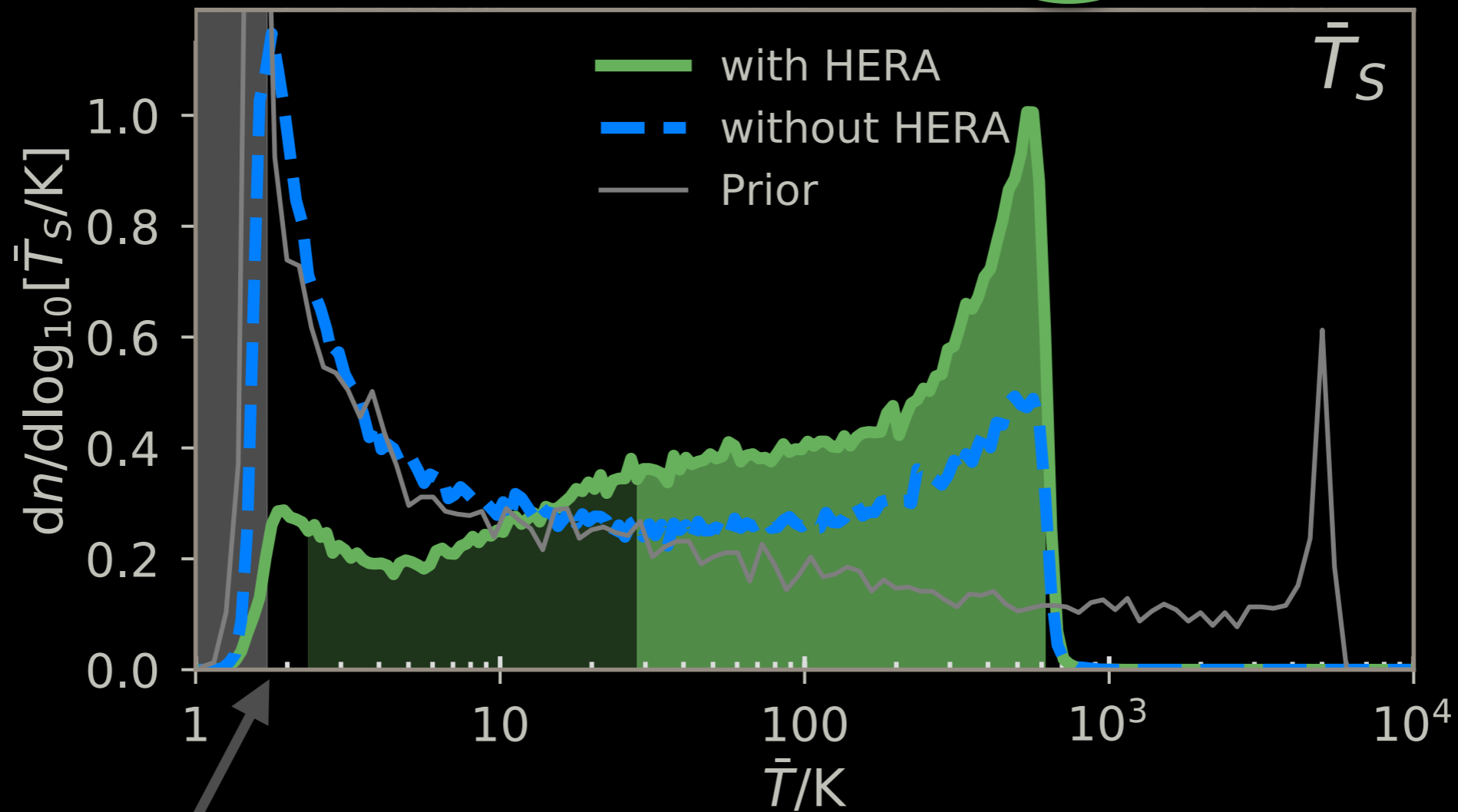


We then spun up the whole 21 cm MCMC machinery for theoretical interpretation.



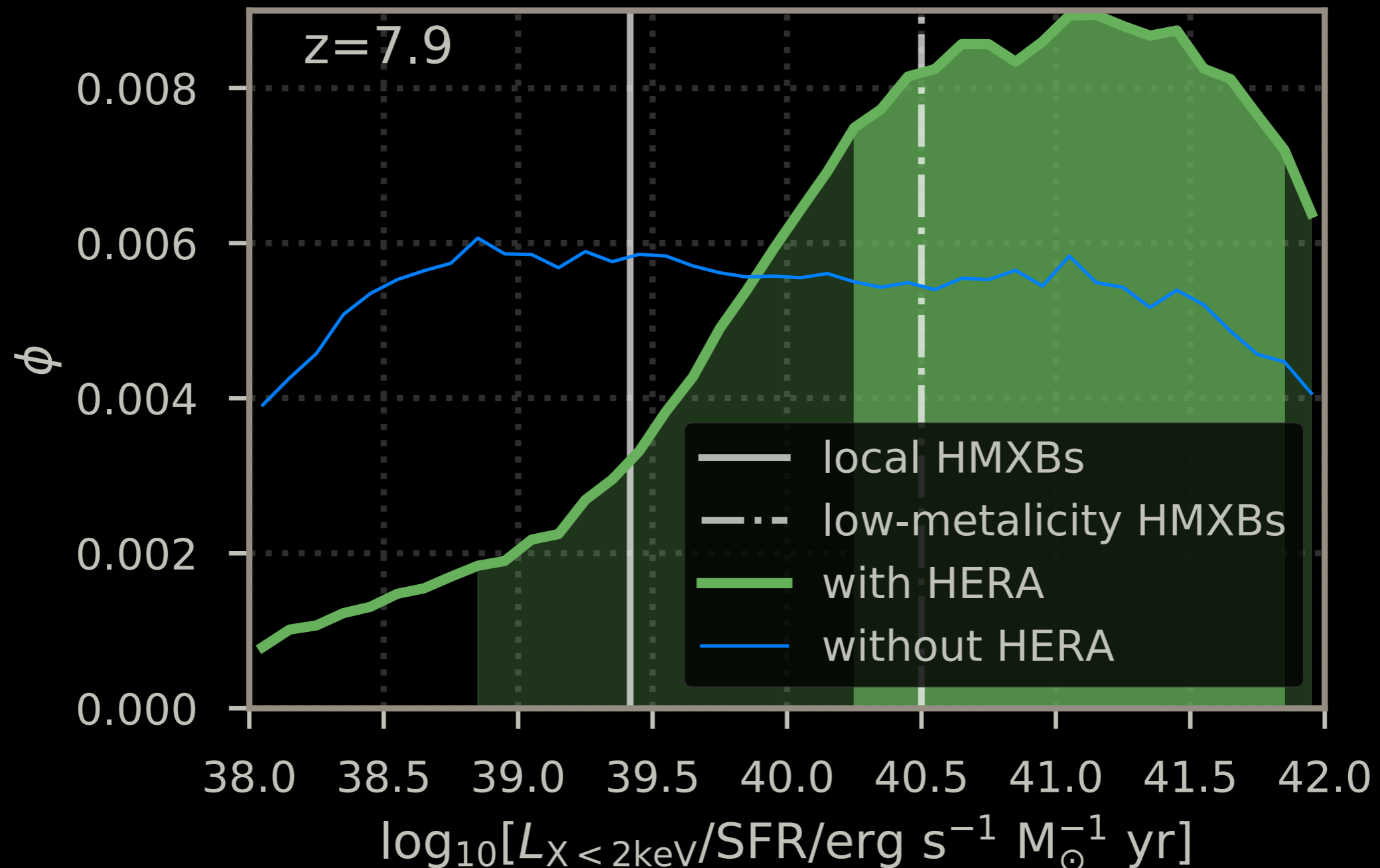
At $>95\%$ confidence, we can say the IGM was heated above the adiabatic limit at $z = 7.9$.

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

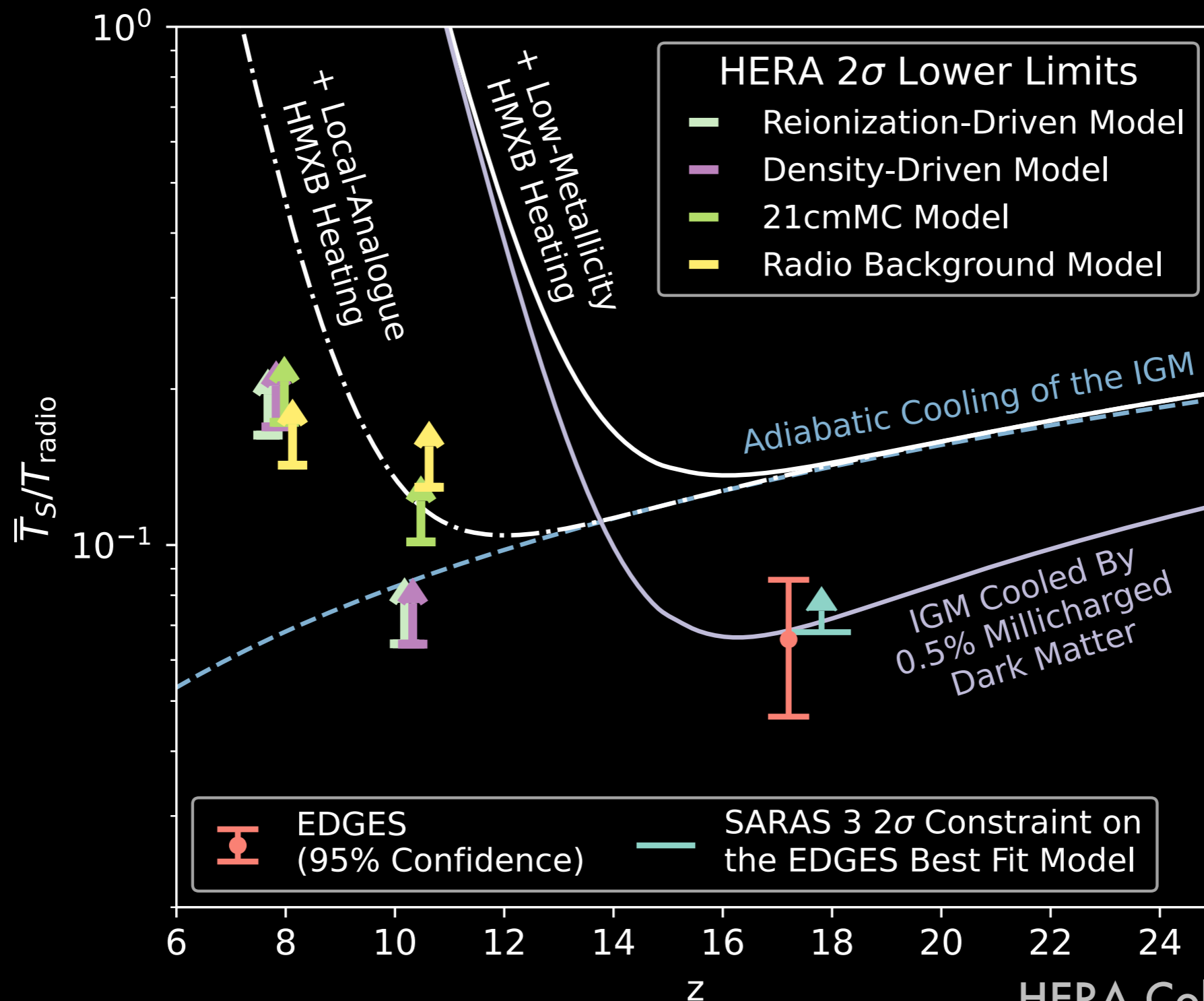


Adiabatic Cooling
Since Recombination

If this heating is dominated by HMXBs, as is generally believed, this favors low-metallicity HMXBs over local analogues.

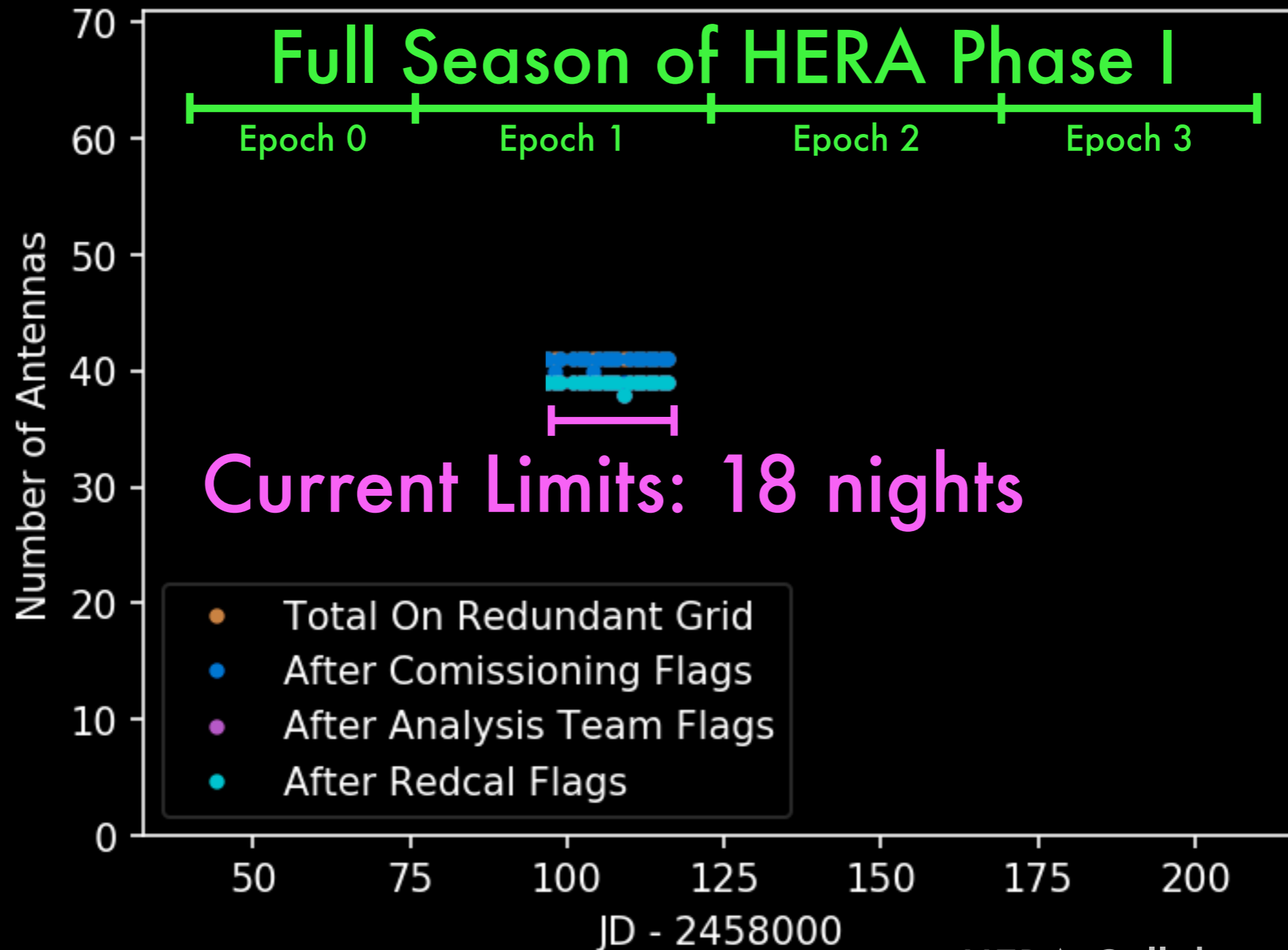


We studied heating with four independent models, which are generally consistent, but we can't say anything about EDGES quite yet.

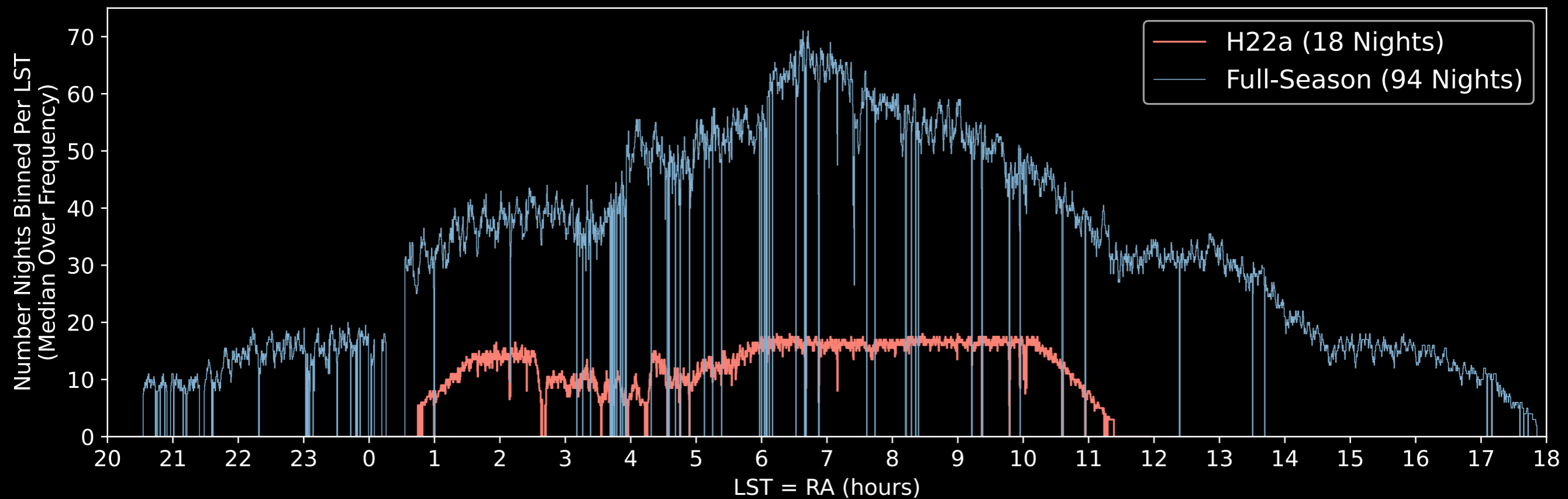


What's next for HERA?

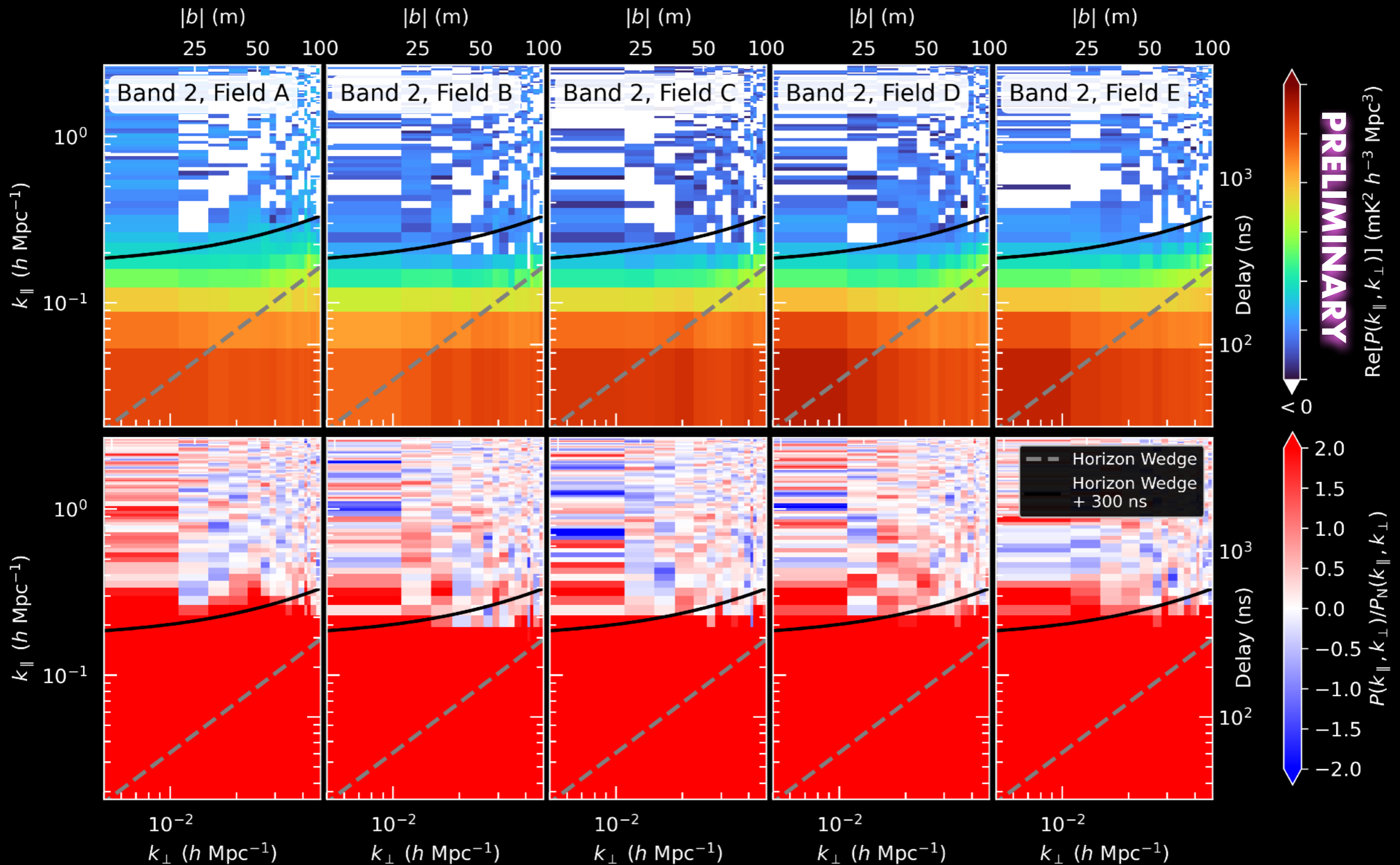
The simplest answer: use more data.



After looking through hundreds of Jupyter notebooks, we've got 94 good nights of data with a similar number of antennas.



With 94 nights, our power spectra and look pretty consistent with noise outside the wedge.



HERA Collaboration (in prep.)

Next steps for HERA Phase I:

- We've re-run our end-to-end simulations, our statistical tests and jack-knives, and our astrophysical inference and interpretation machinery.
- I'm writing everything up and we're in internal review now.
- From a pure sensitivity perspective, this $P(k)$ limit could be as much as *~3 times deeper*.

With a full season we'll likely be able to...

- Rule out most “cold-reionization” scenarios.
- Show that the IGM was X-ray heated at $z = 10.4$.
- Show that the HMXBs that probably heated the IGM were very low-metallicity.

Meanwhile, we're continuing
to build out to 350 antennas.



Everything but the dishes is new, including our wide-band Vivaldi feeds that go from 50 – 250 MHz ($4.7 > z > 29$).



Photo: Ziyaad Halday

We'll have way more sensitivity with a full season (~100 nights) and the full array, and should easily rule EDGES in or out.

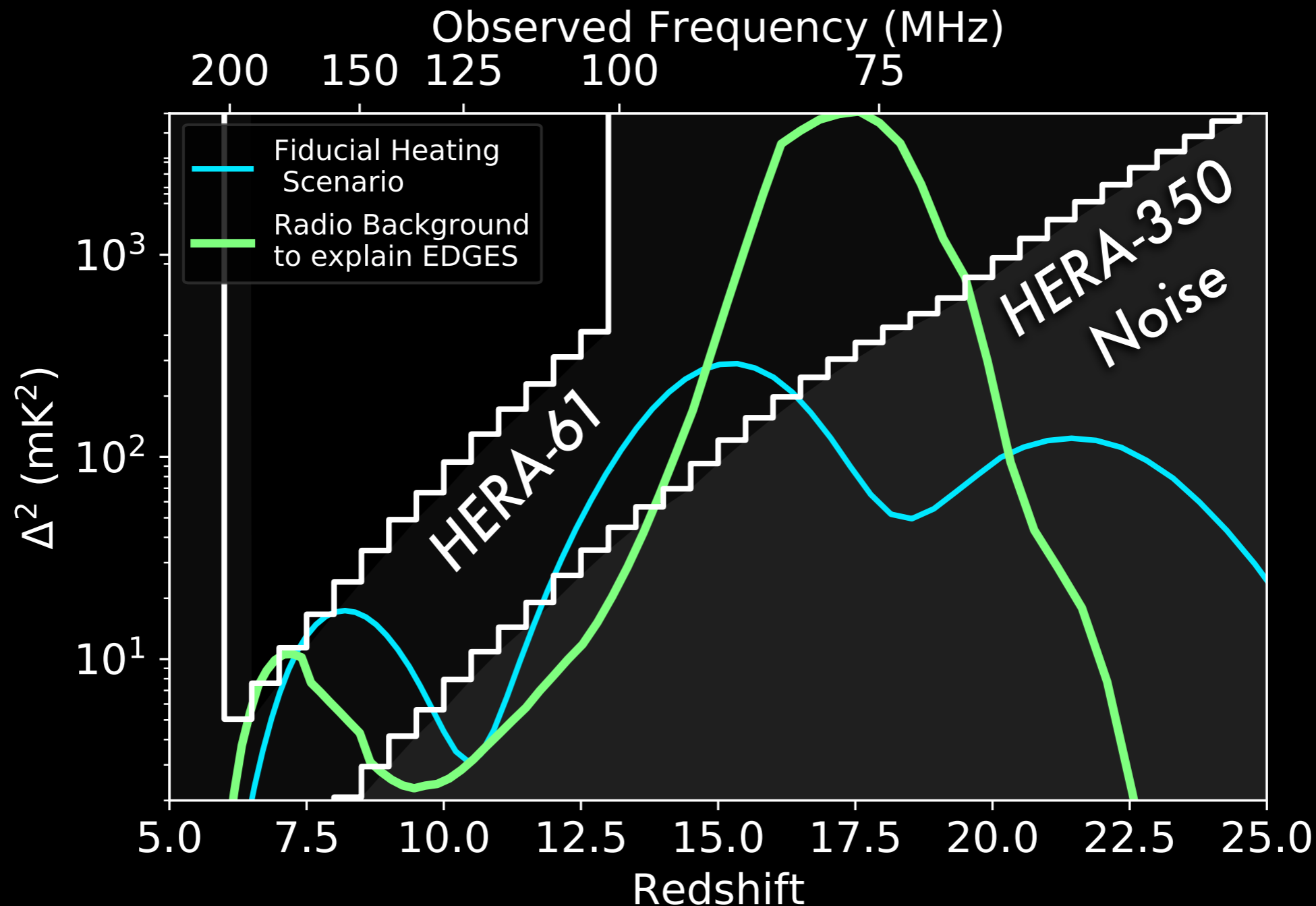
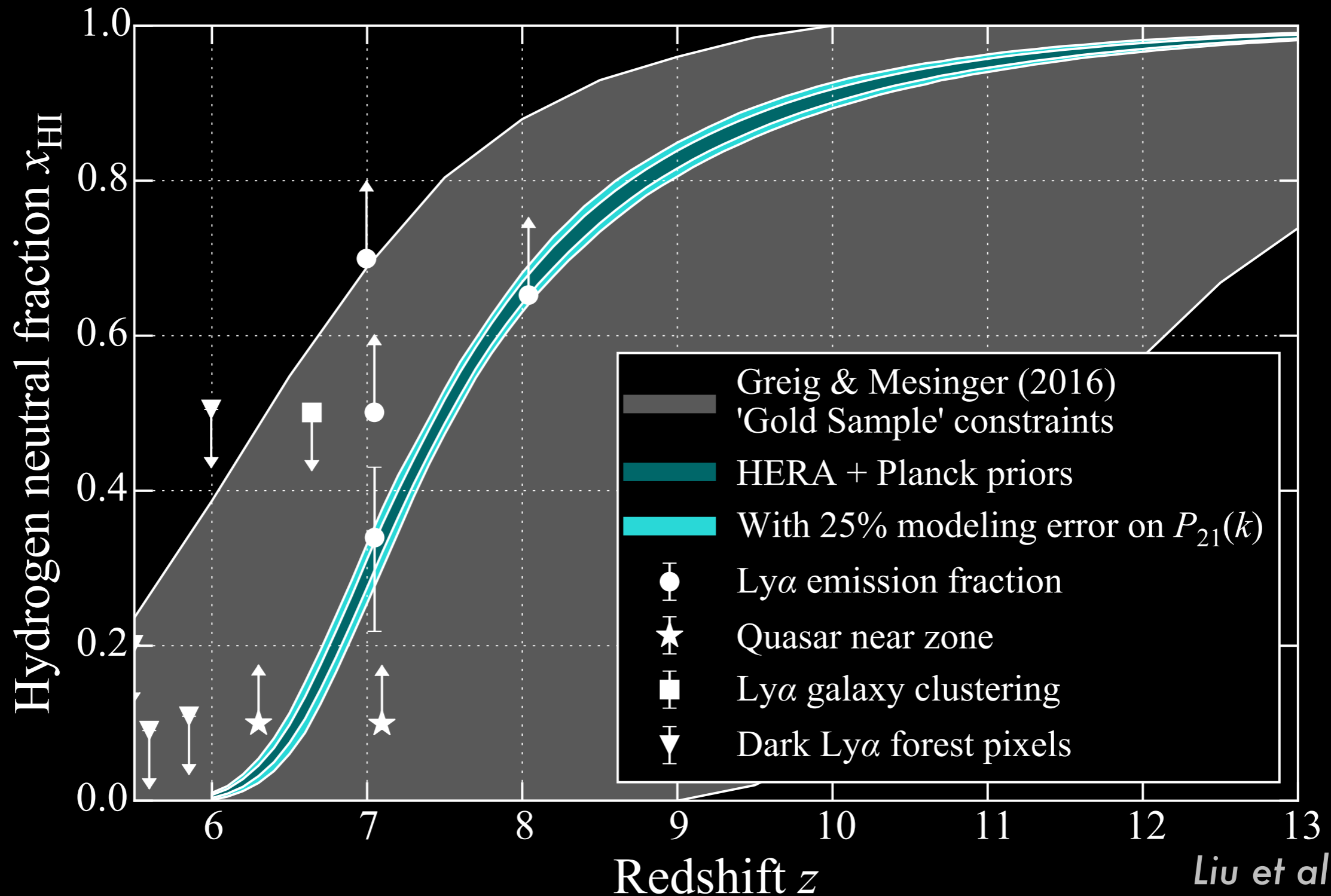
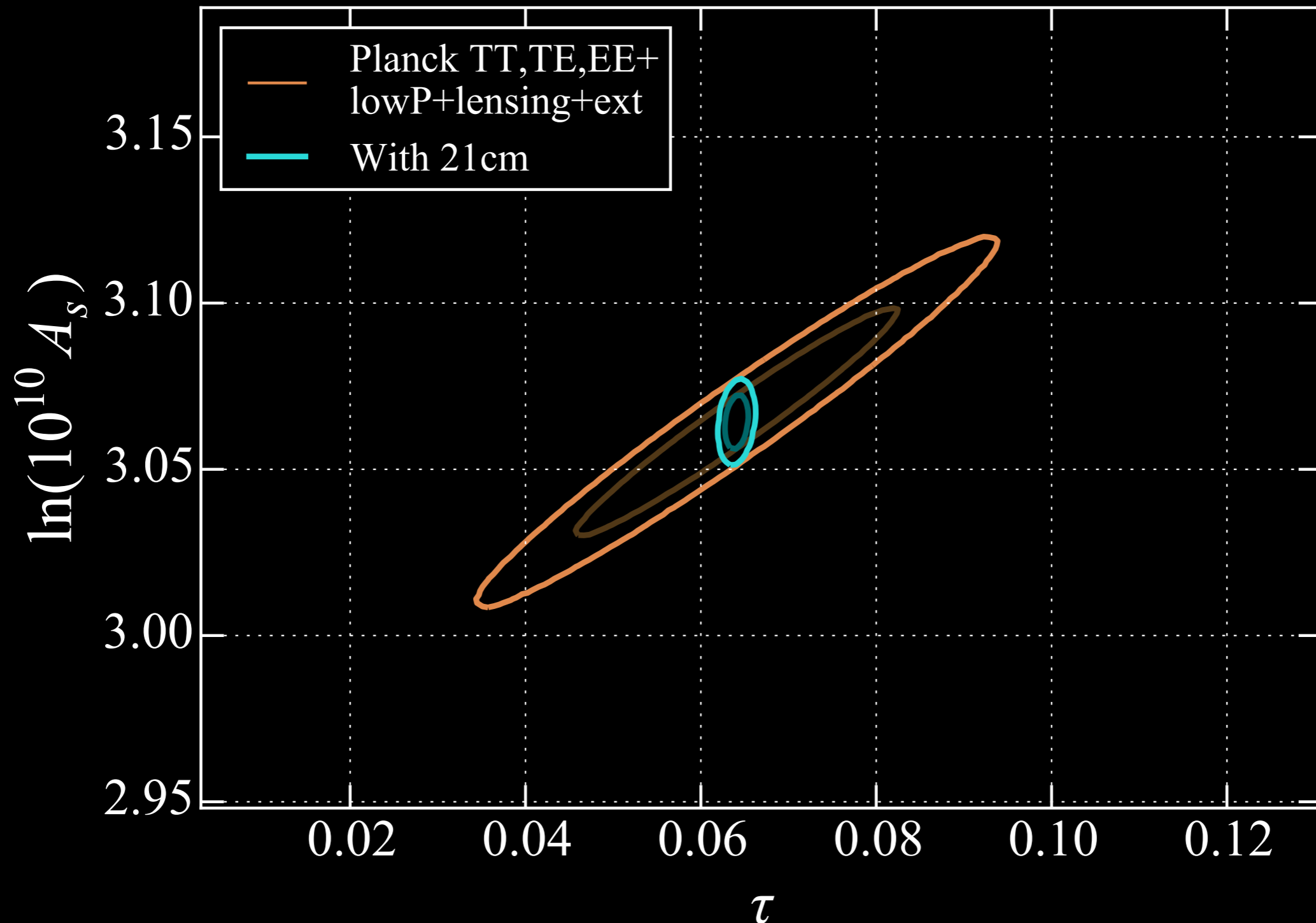


Figure: Aaron Ewall-Wice

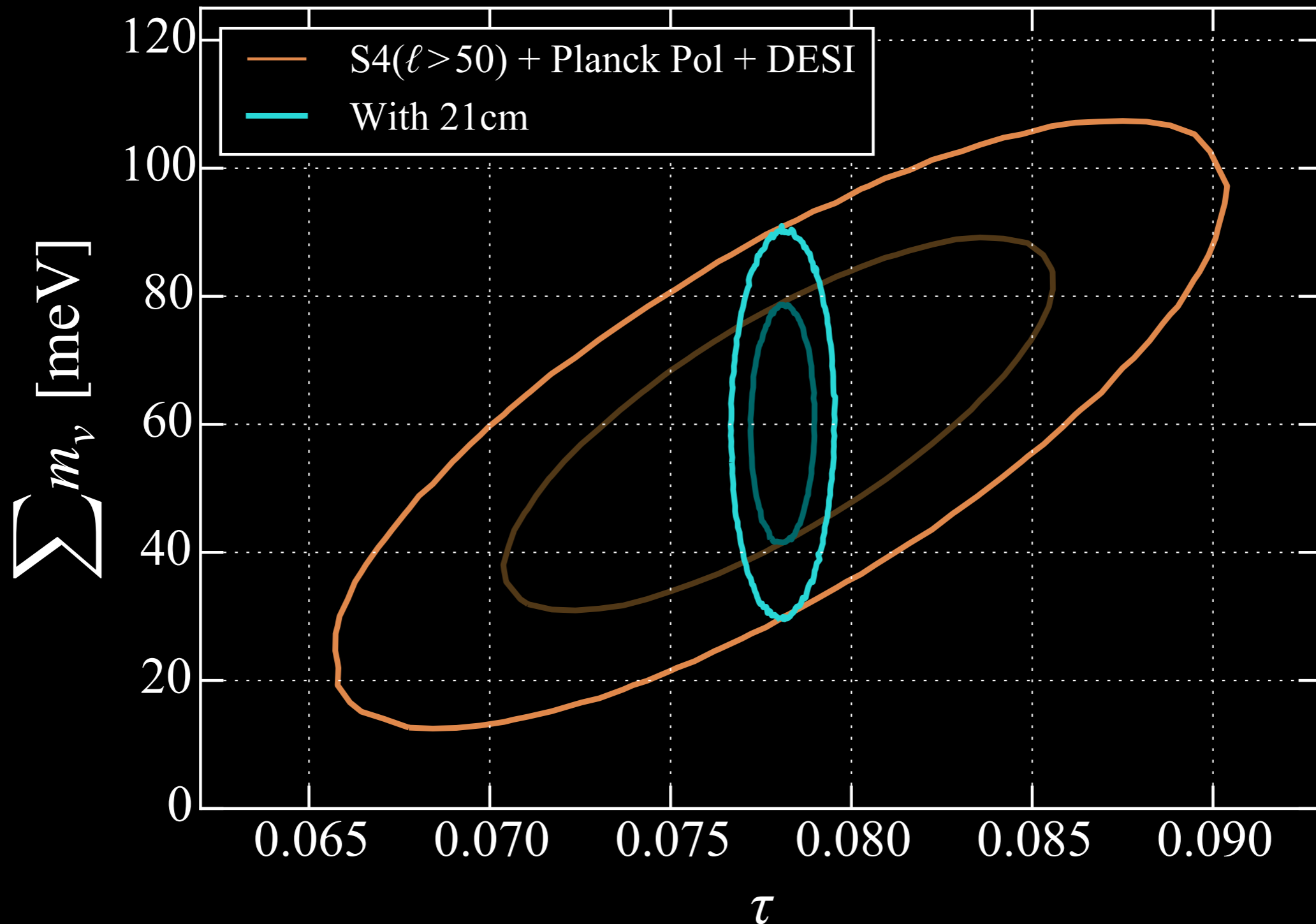
Which means we can precisely measure the ionization history of the universe.



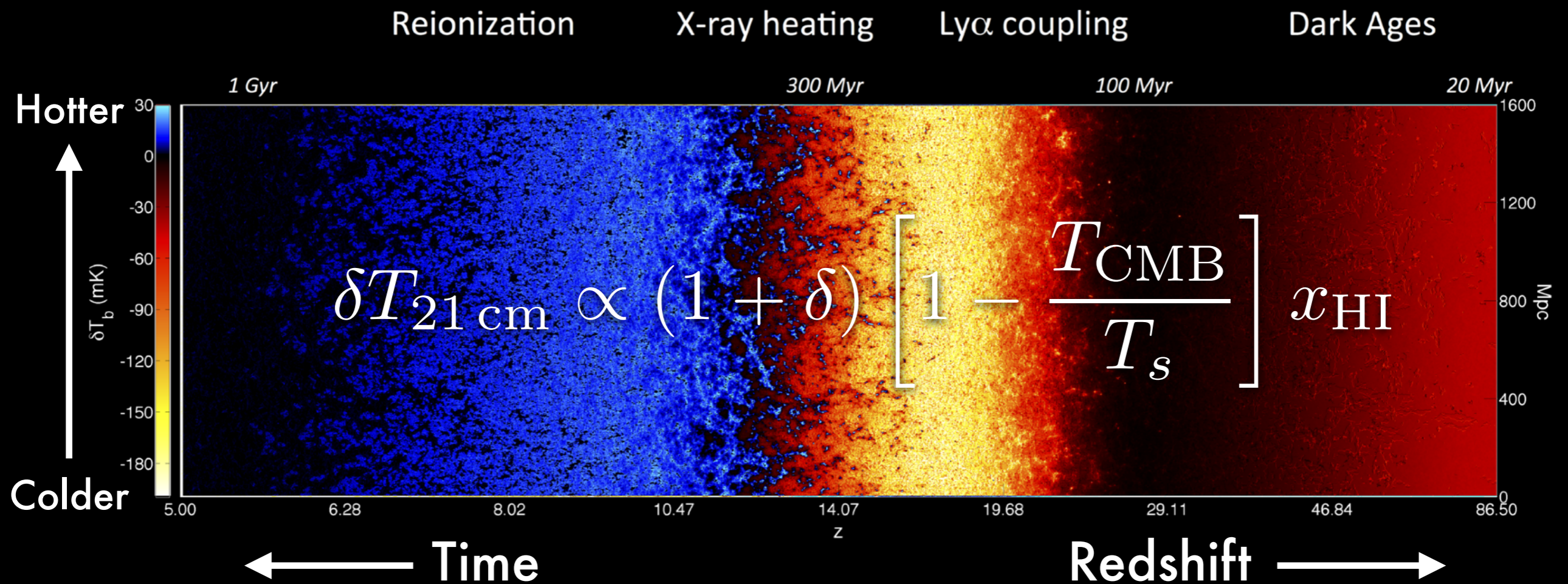
We'll eliminate τ as a CMB nuisance parameter, improving A_s errors by a factor of 4.

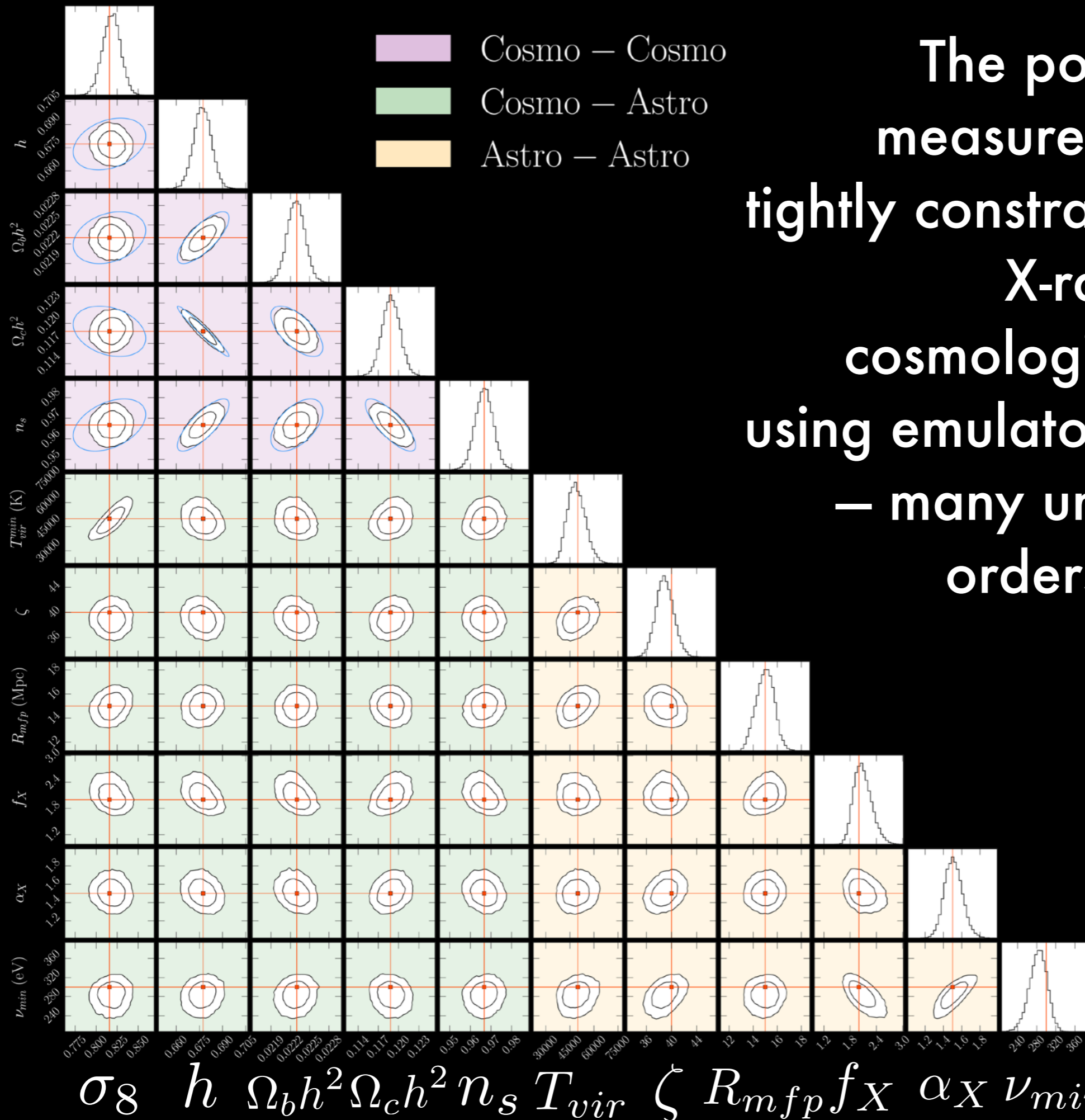


And, maybe increase the significance of a detection of non-zero Σm_ν with CMB-S4.



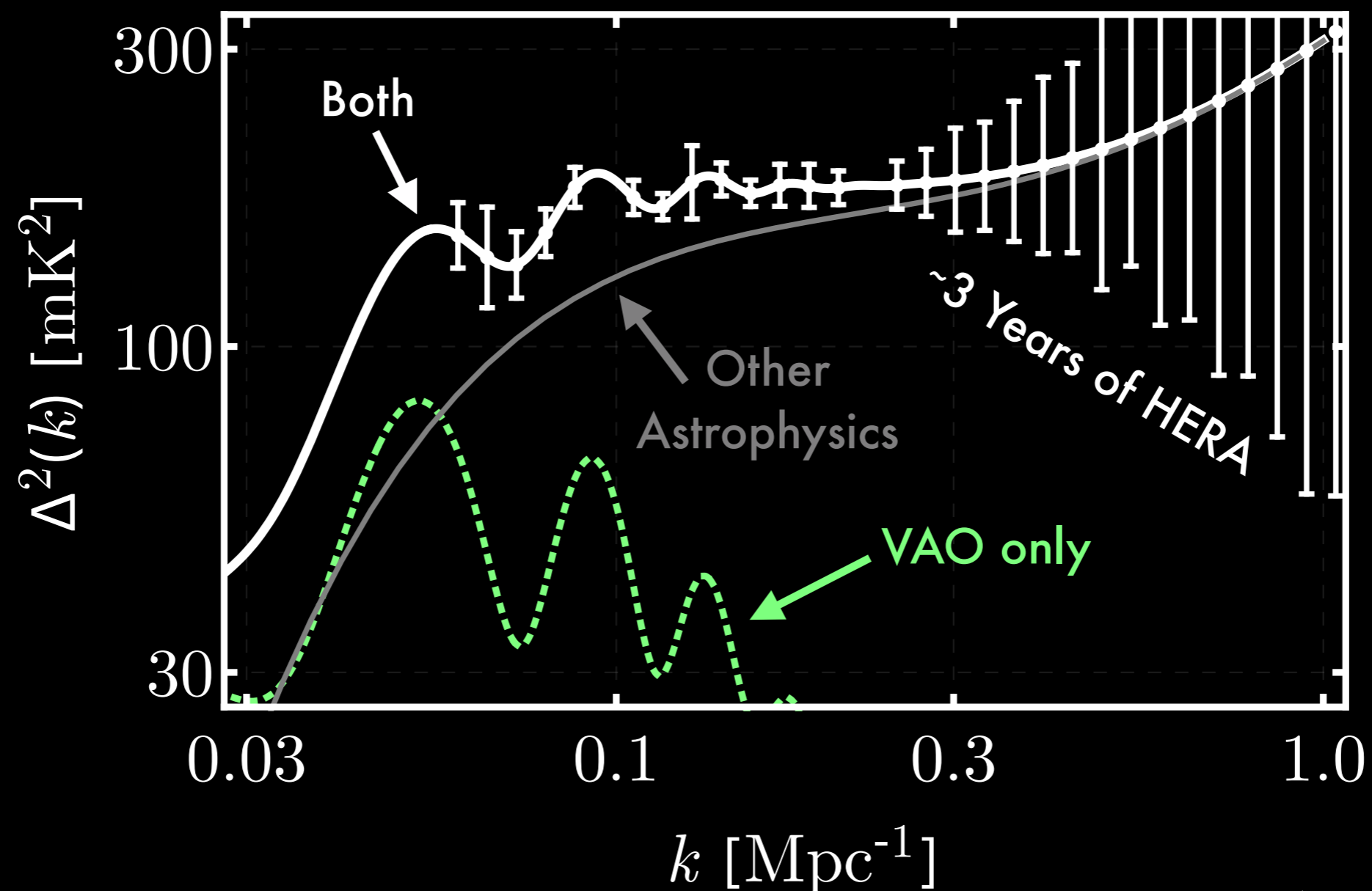
There's also complex, interconnected astrophysics across a wide range of redshifts to explore, even if EDGES is wrong.



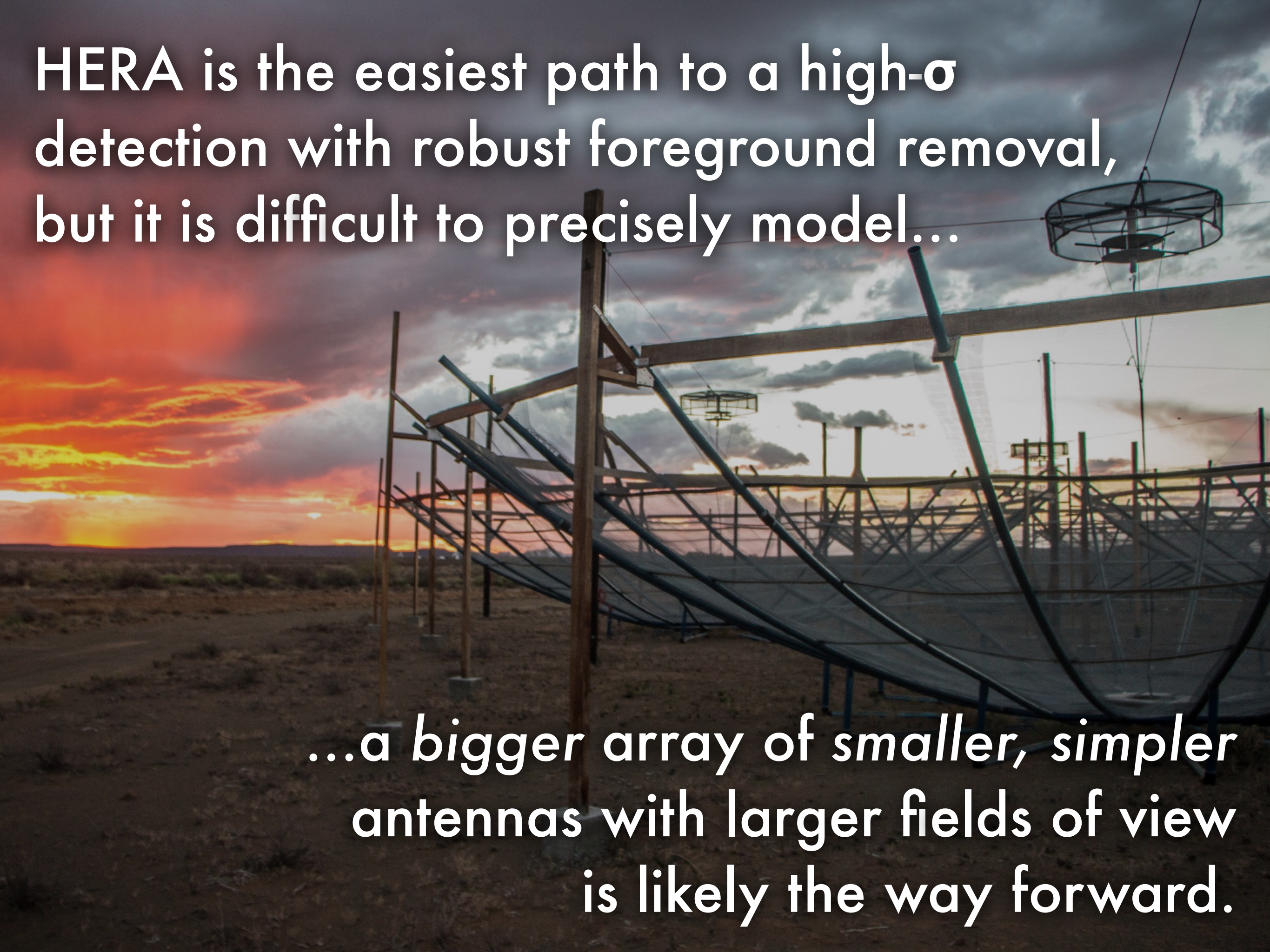


The power spectra we measure with HERA will tightly constrain reionization, X-ray heating, and cosmological parameters using emulators and MCMCs – many unconstrained by orders of magnitude!

With a few years of observing, we may detect velocity acoustic oscillations, providing a new standard ruler at $z \approx 16$.



What comes next?

A photograph of a large radio telescope array, likely the Murchison Widefield Array (MWA), at sunset. The sky is a mix of orange, red, and grey clouds. The foreground shows the complex metal structure of the telescope, including a large parabolic dish and various support beams. The ground is dark and appears to be a flat, open field.

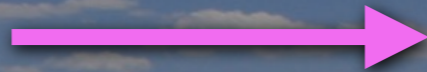
HERA is the easiest path to a high- σ detection with robust foreground removal, but it is difficult to precisely model...

...a *bigger* array of *smaller, simpler* antennas with larger fields of view is likely the way forward.

There's a problem with how we measure visibilities.

$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

Measure antenna
voltages $v_i(t)$.



Fourier transform
to frequency: $\tilde{v}_i(\nu)$

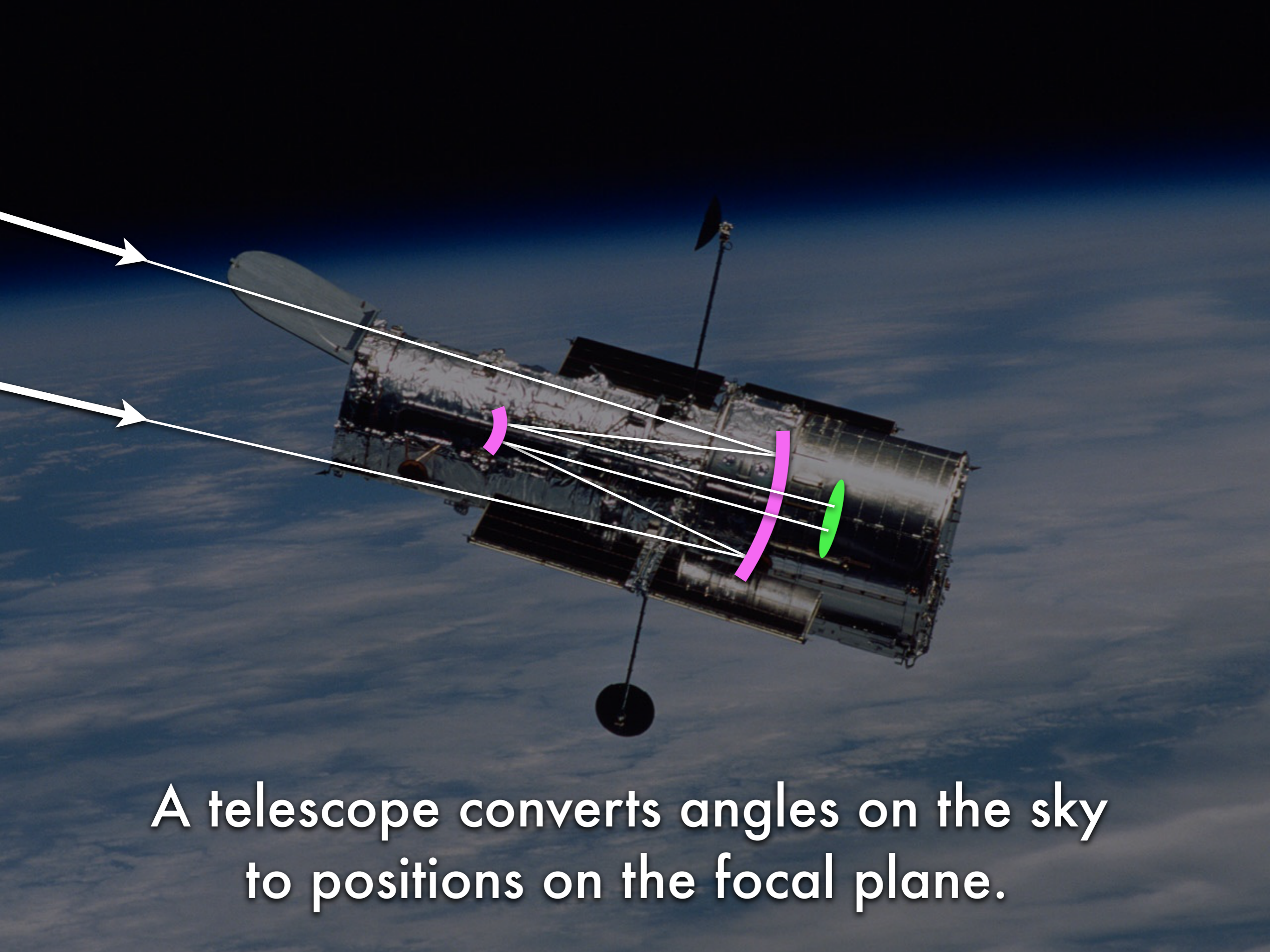


Correlate antennas to form visibilities:

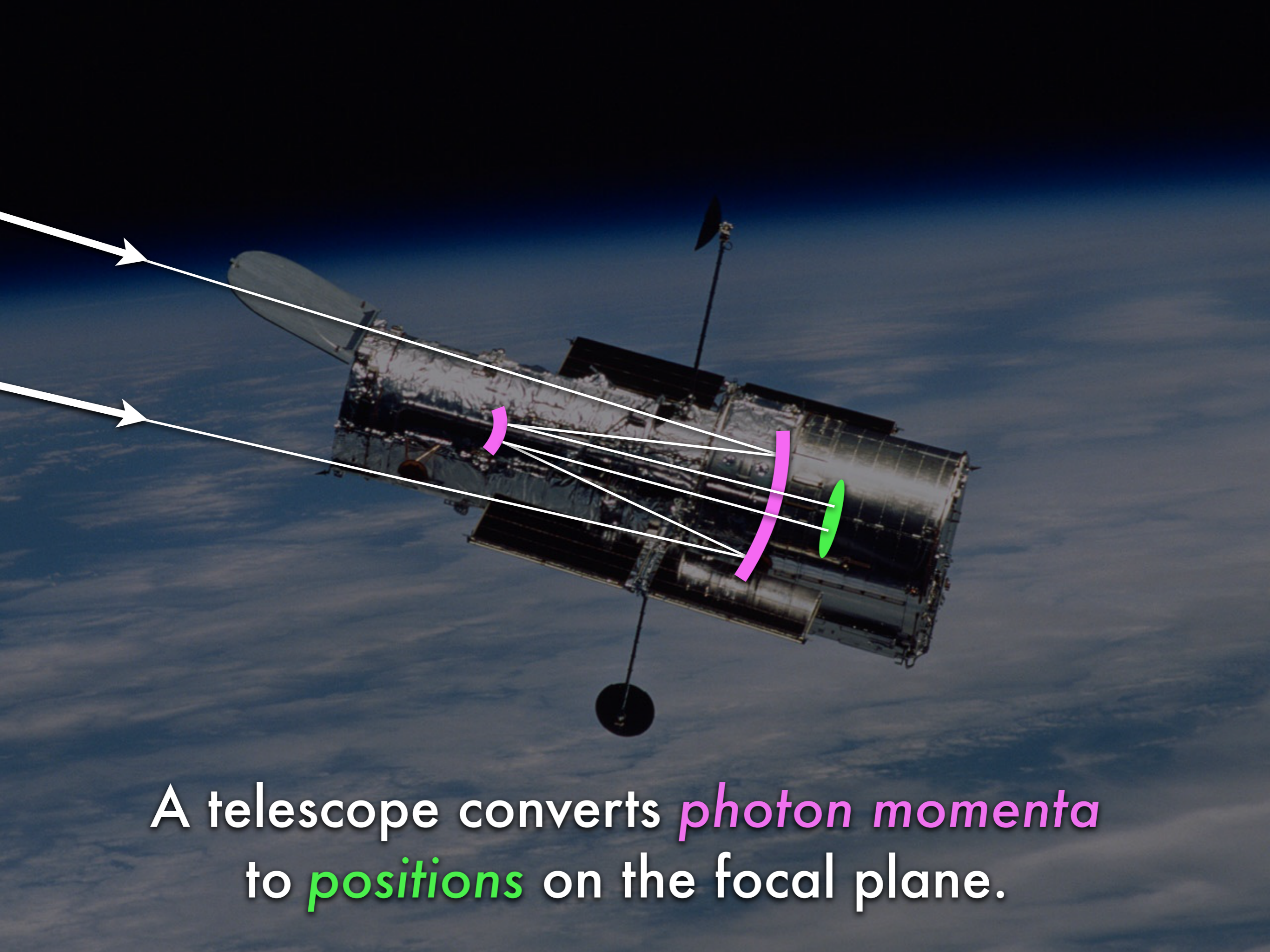
$$\langle \tilde{v}_i(\nu) \tilde{v}_j^*(\nu) \rangle = V_{ij}(\nu)$$

This scales like $O(N^2)$!

All telescopes are
Fourier transformers.



A telescope converts angles on the sky to positions on the focal plane.



A telescope converts *photon momenta* to *positions* on the focal plane.

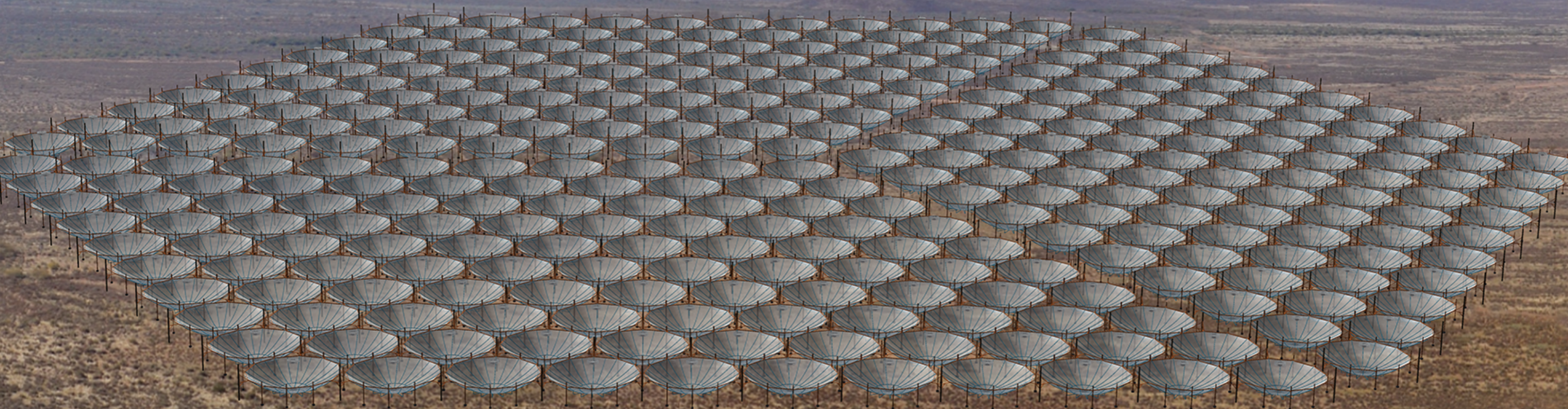
$$V_{ij}(\nu) = \int B_{ij}(\hat{\mathbf{r}}, \nu) I(\hat{\mathbf{r}}, \nu) \exp \left[-2\pi i \frac{\nu}{c} \mathbf{b}_{ij} \cdot \hat{\mathbf{r}} \right] d\Omega$$

can be rewritten suggestively as...

$$\langle \tilde{v}_i(k) \tilde{v}_j^* \rangle = \int B(\mathbf{k}) I(\mathbf{k}) \exp [i\mathbf{k} \cdot (\mathbf{x}_i - \mathbf{x}_j)] d\Omega$$

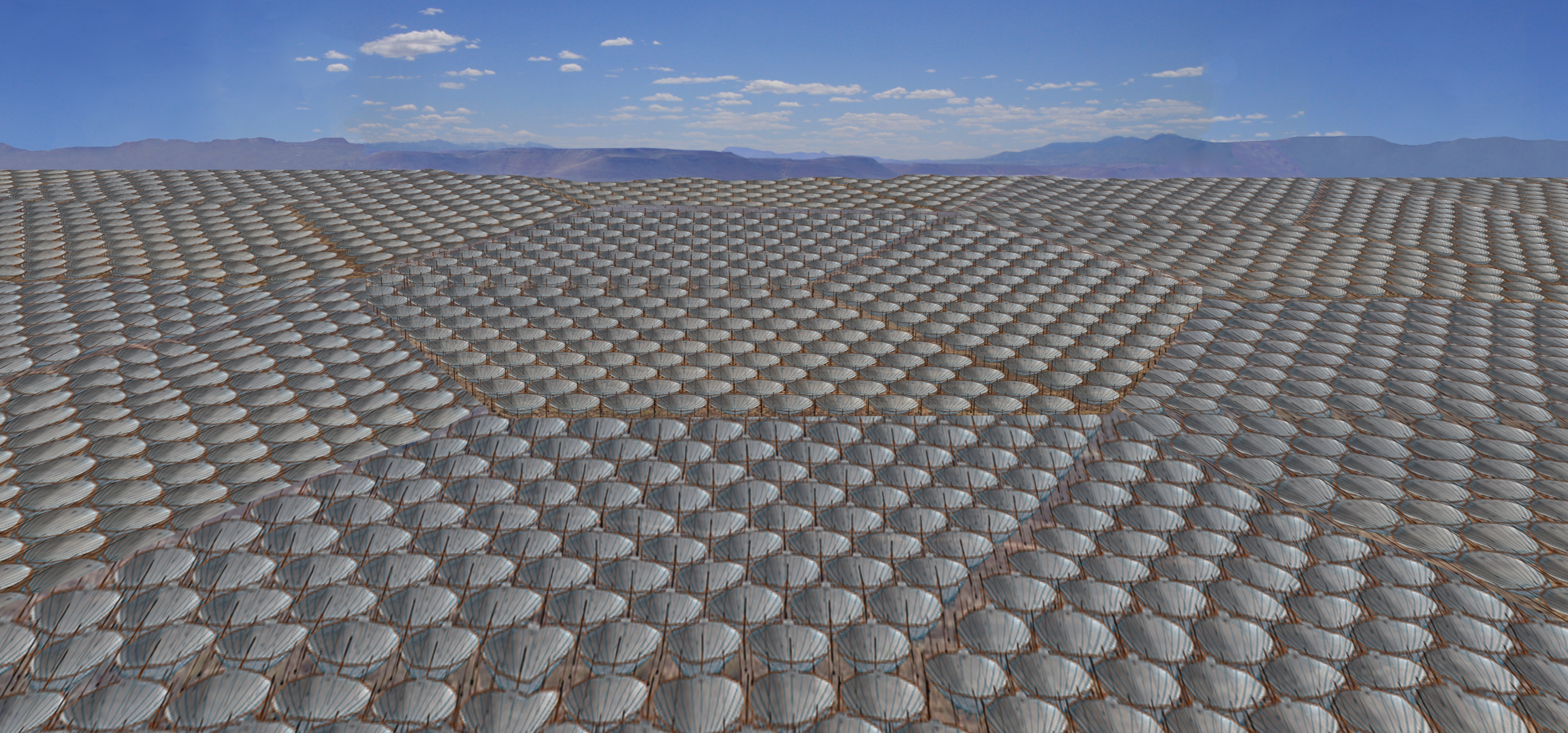
If antenna positions \mathbf{x}_i are on a regular grid,
we can directly sample the electric field, FFT,
and square to get beam-weighted maps...
effectively correlating in $O(N \log N)$!

An FFT Telescope can be bigger than HERA.



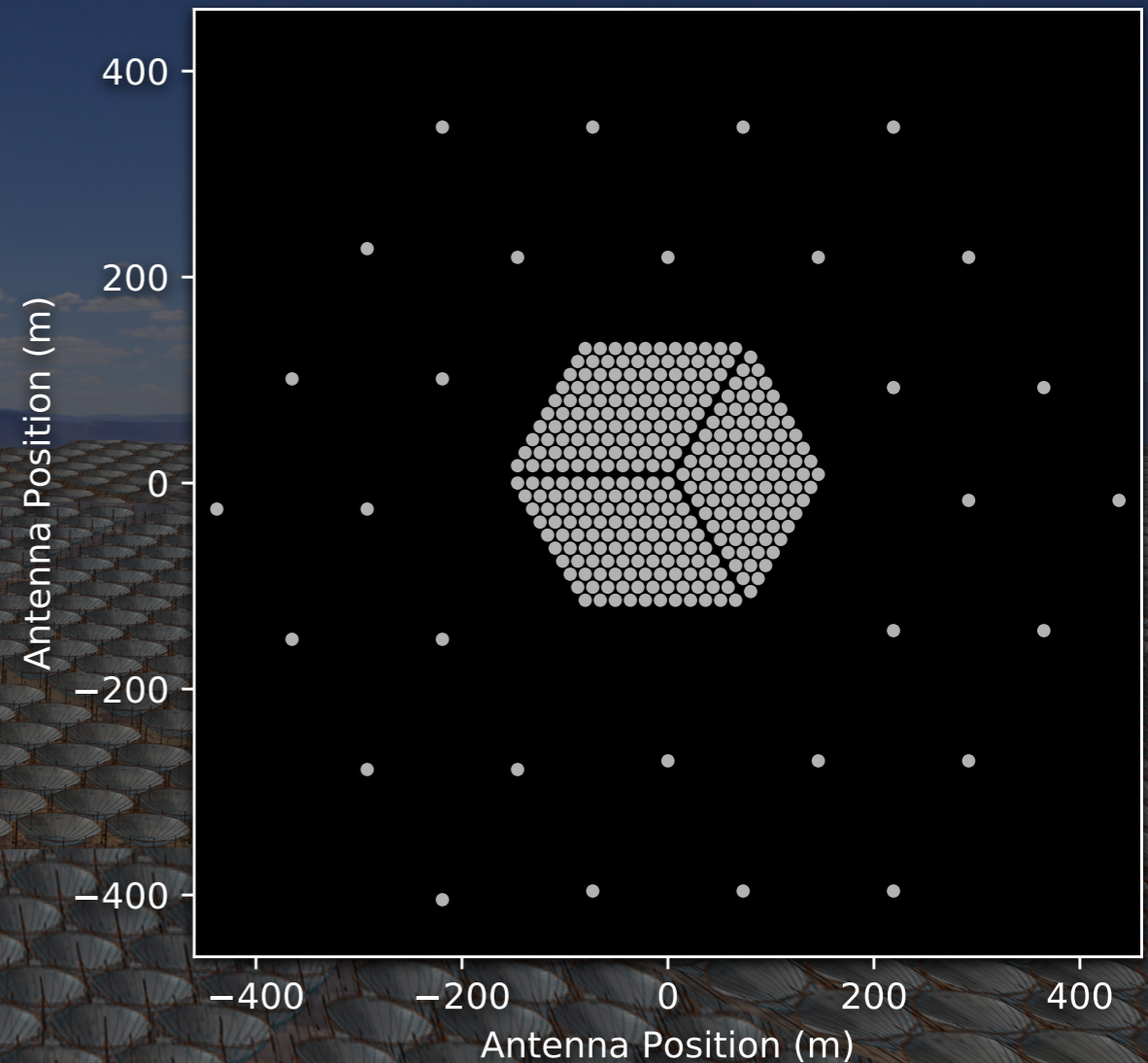
An FFT Telescope can be bigger than HERA.

Much, *much* bigger.

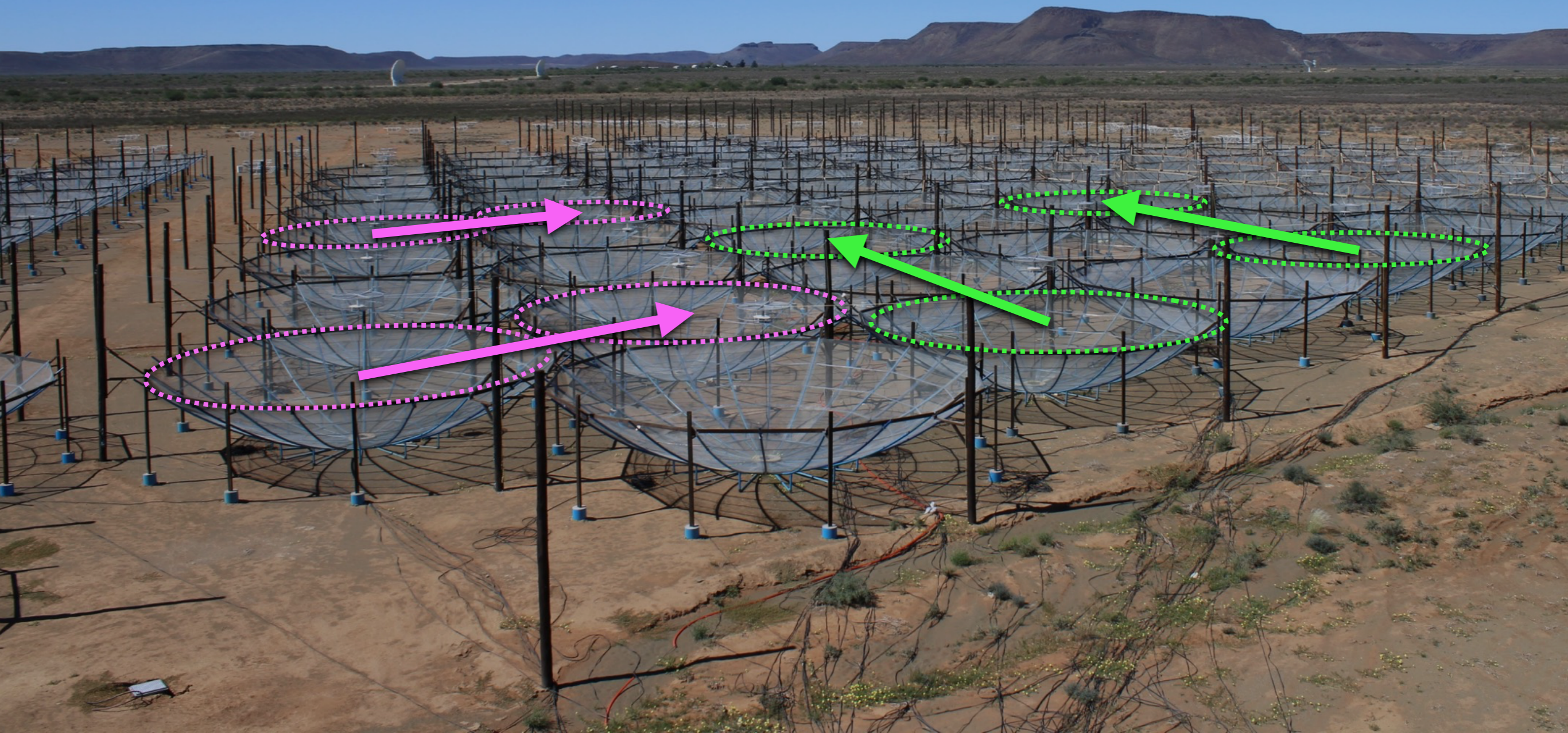


An FFT Telescope needs to be...

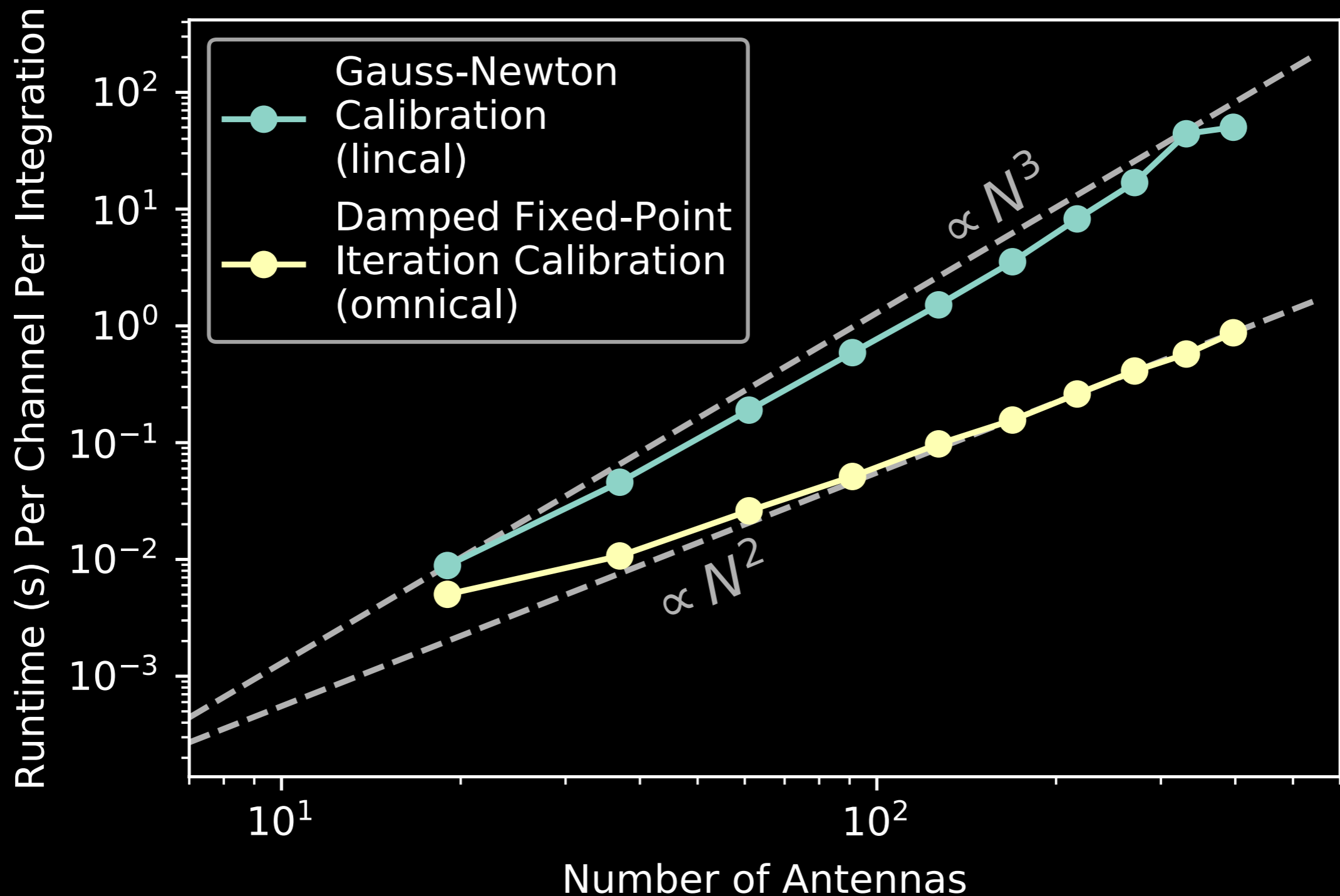
- Co-planar.
- Made up of identical antenna elements with identical beams.
 - To avoid EoR window contamination (Orosz, Dillon, et al. 2018)
- On a regular or hierarchically regular grid.
 - I designed HERA's layout for FFT correlation (Dillon & Parsons 2016)
- Calibrated in real time.



Real-time redundant-baseline calibration of regular arrays is precisely what we're learning to do with HERA!

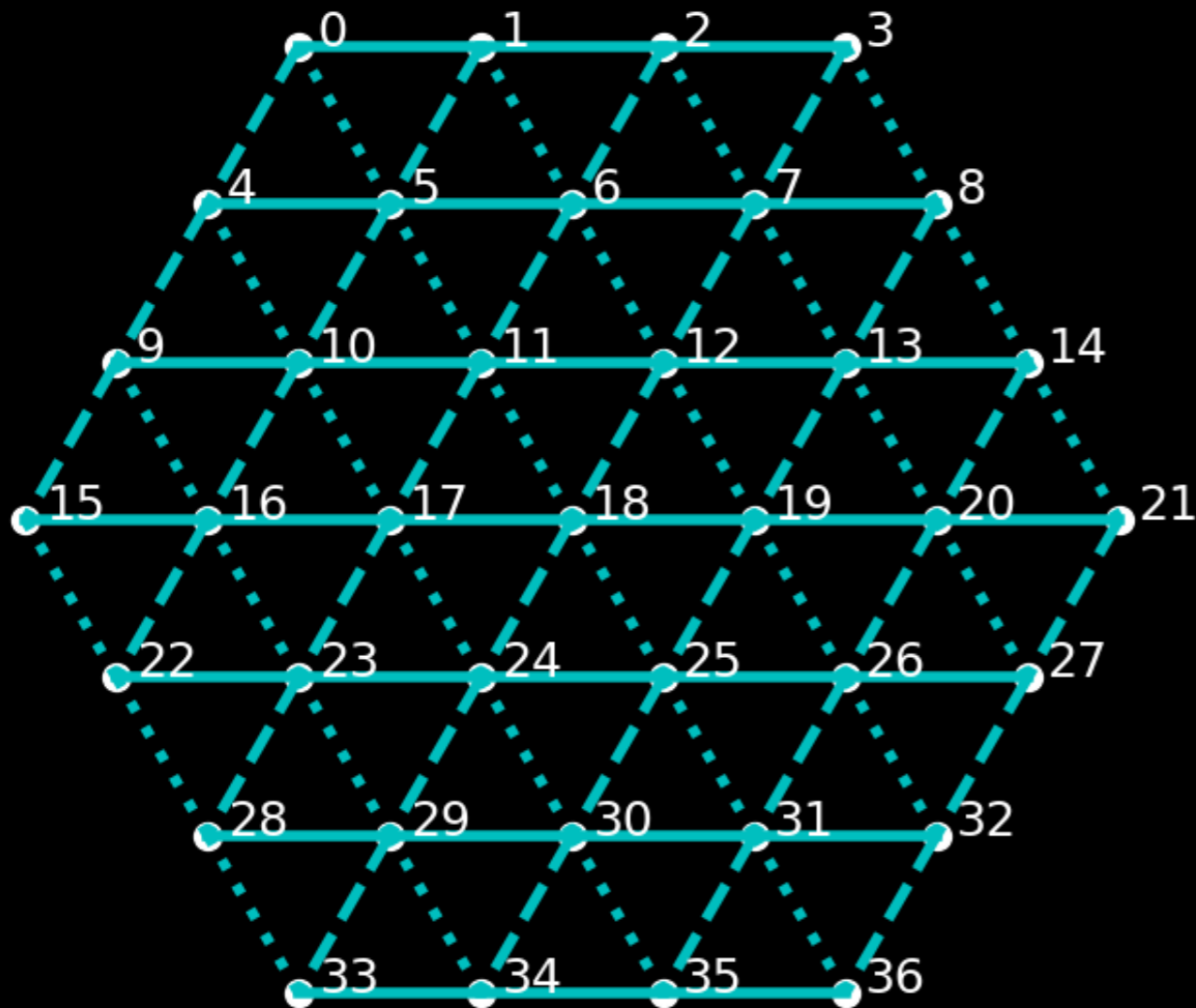


We showed how to speed up redundant calibration from $O(N^3)$ to $O(N^2)$.



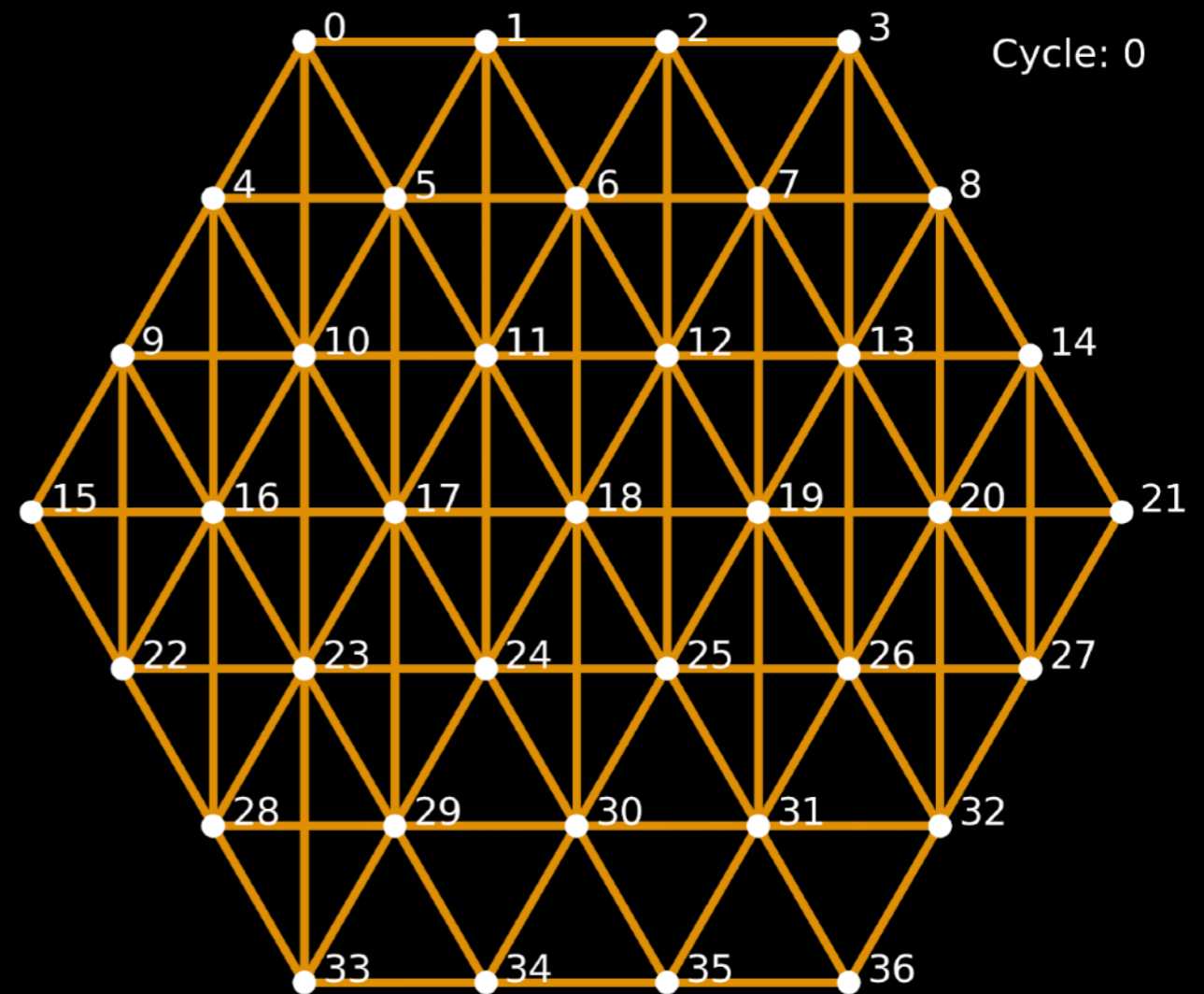
And how to use a subset of the data to reduce calibration from $O(N^2)$ to $O(N \log N)$.

Subset-Redundant Calibration



vs.

Low-Cadence Calibration



FFTs could map the majority of the volume of the observable universe, giving us...

Direct measurements of small-scale density fluctuations at early times:

- Warm dark matter (Sitwell et al. 2013)
- Tests of inflation via non-Gaussianity (Cooray et al. 2008) or spectral index running (Mao et al. 2008)

A precise thermal history of the universe, constraining:

- Dark matter annihilation and decay (Evoli et al. 2014)
- Primordial black hole evaporation (Mack & Wesley 2008)

Unprecedented constraints on the standard model of cosmology:

- Orders of magnitude better than Planck, e.g. $\Delta\Omega_k \approx .0002$ and $\Delta\Sigma\nu \approx 7$ meV (Mao et al. 2008)

In Summary:

- 21 cm cosmology promises to become the premier probe of the Cosmic Dawn and reionization.
- Foregrounds and systematics are major challenges. Different telescopes have taken very different approaches to overcome them.
- HERA has set the world-leading upper limits with just 18 nights of data and a very conservative analysis.
- A lot more data is coming down the pipe which will enable precise constraints of the astrophysics of reionization and, in time, tests of our cosmological models.