



THE UNIVERSITY
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HI stacking with MeerKLASS

Challenges, Results and Prospects for SKAO x Euclid

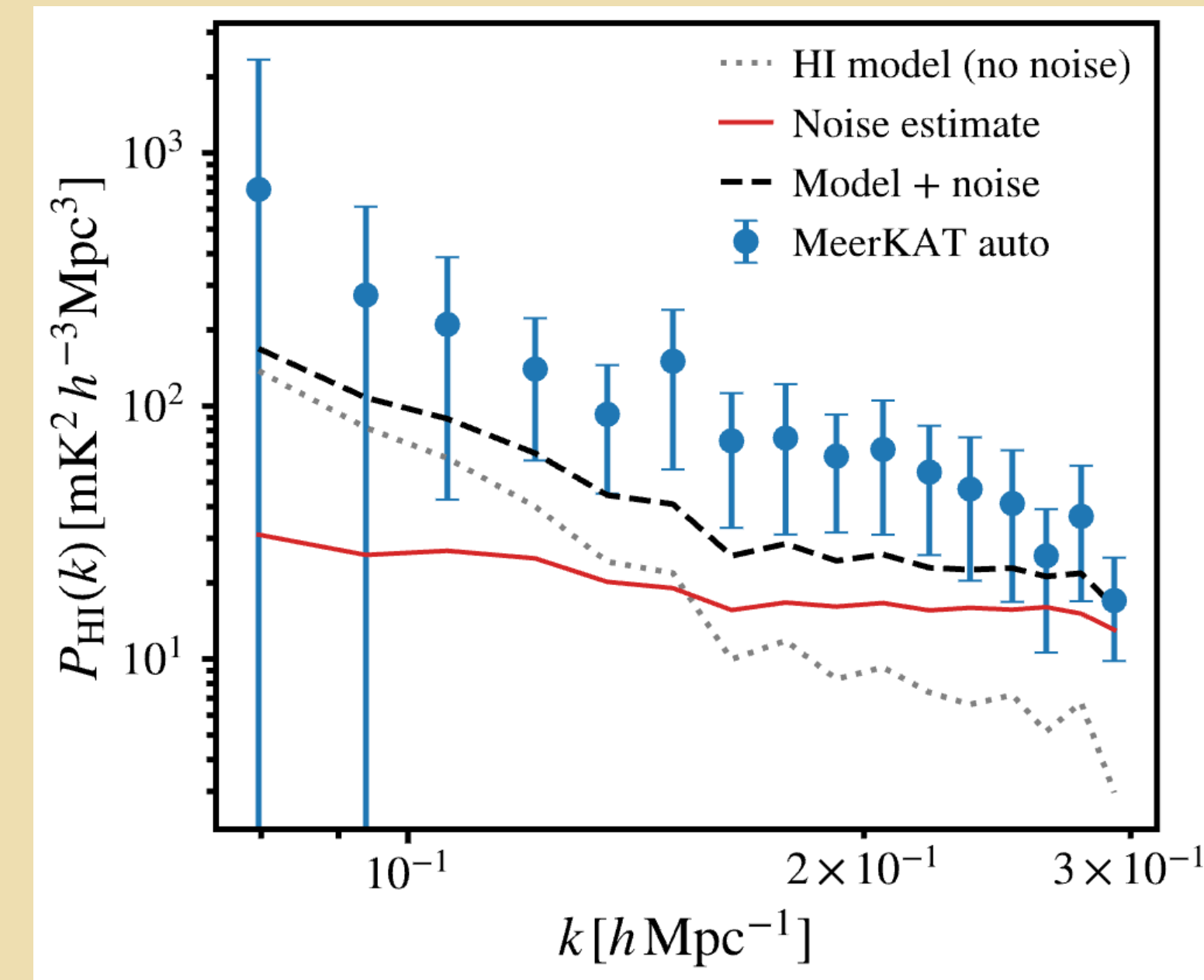
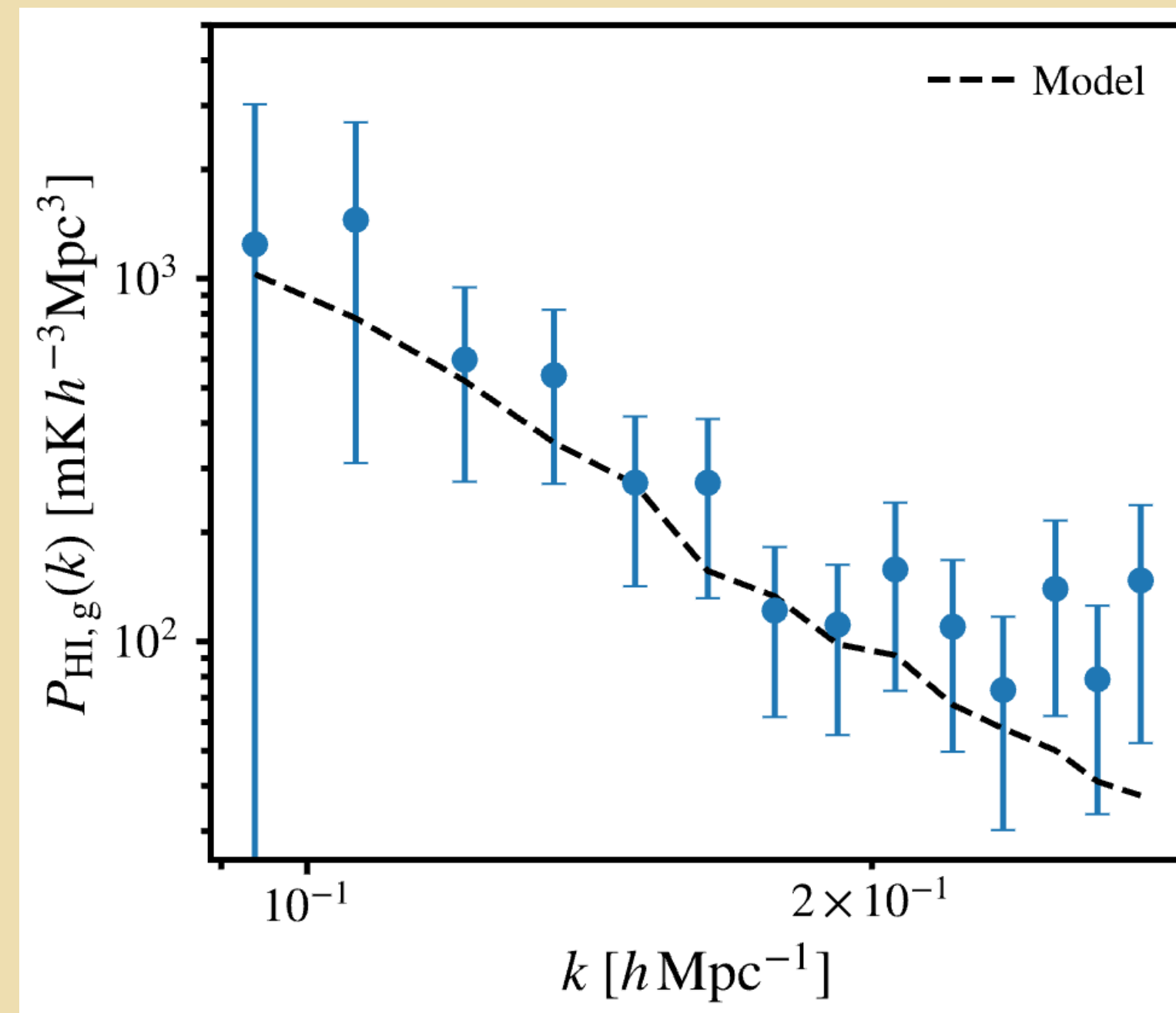
陈兆庭 (Chen, Zhaoting),
with Alkistis Pourtsidou, Steve Cunnington and Laura Wolz

TOSCA Meeting
07/11/2024

The MeerKLASS L-band deep-field survey

The MeerKLASS collaboration, [2407.21626](https://arxiv.org/abs/2407.21626)

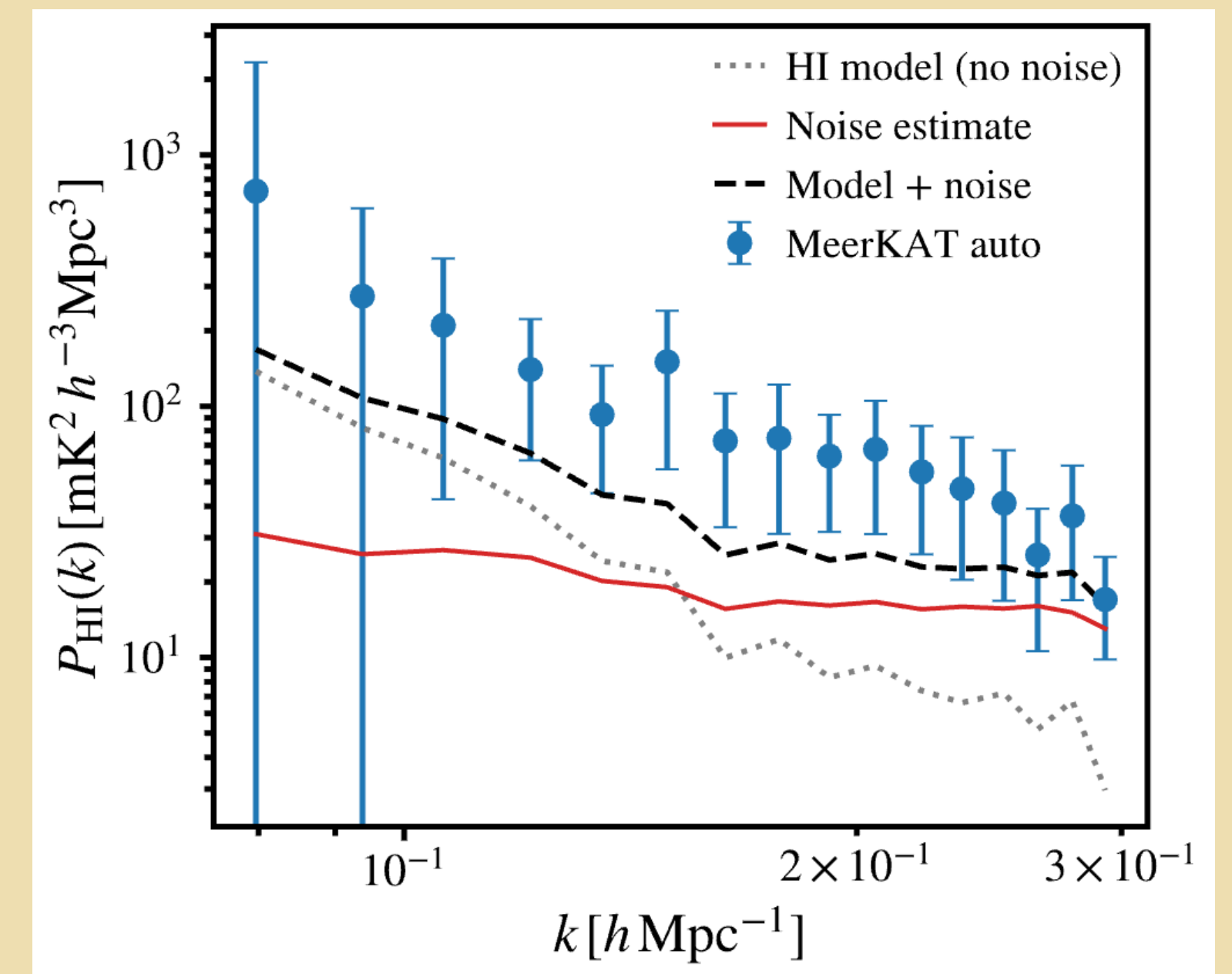
- The deepest single-dish HI intensity mapping survey
- Measurements of cross-correlation power spectrum with GAMA spectroscopic galaxies
- Getting closer to **signal-dominated** regime
- **Auto**-correlation **detection** around the corner



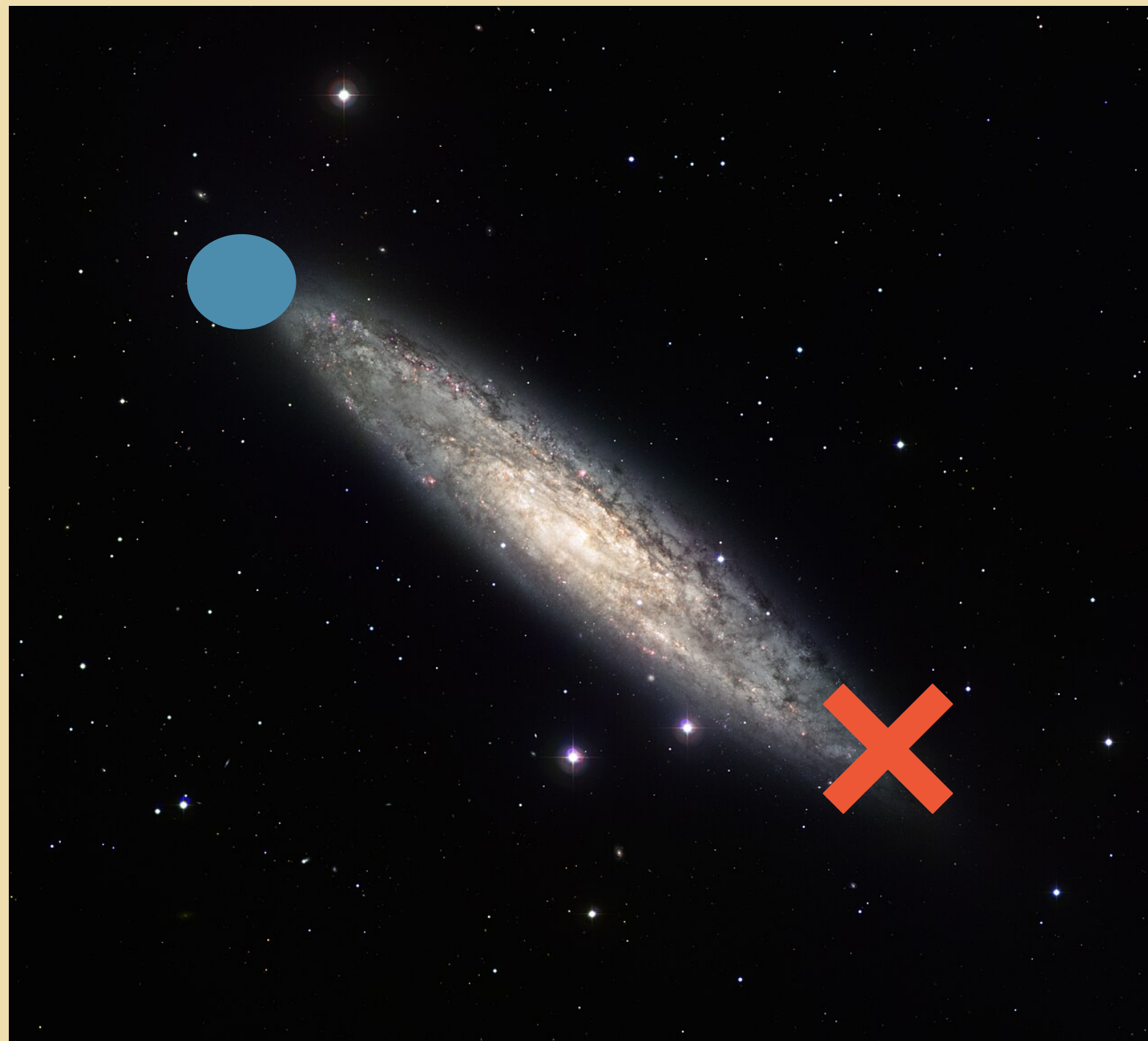
The final push

- Various data analysis techniques are being used to bring the data down to the model line.
- Nevertheless, we need alternative summary statistics that:
- Can be used as diagnostics to **minimise systematics**
- Can be used as complimentary probe to **maximise scientific output**

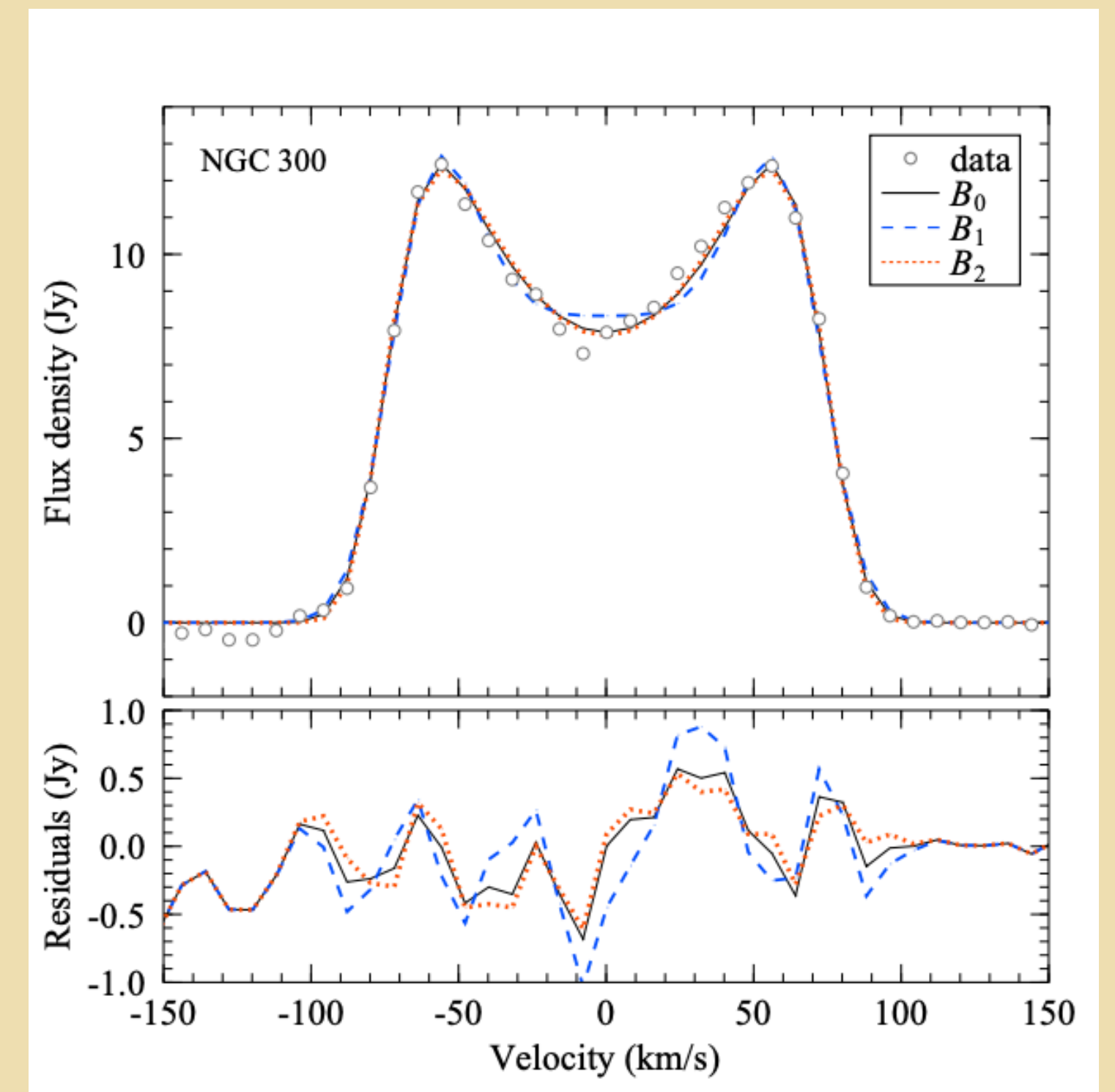
The MeerKLASS collaboration, [2407.21626](#)



The emission line profile of HI galaxy



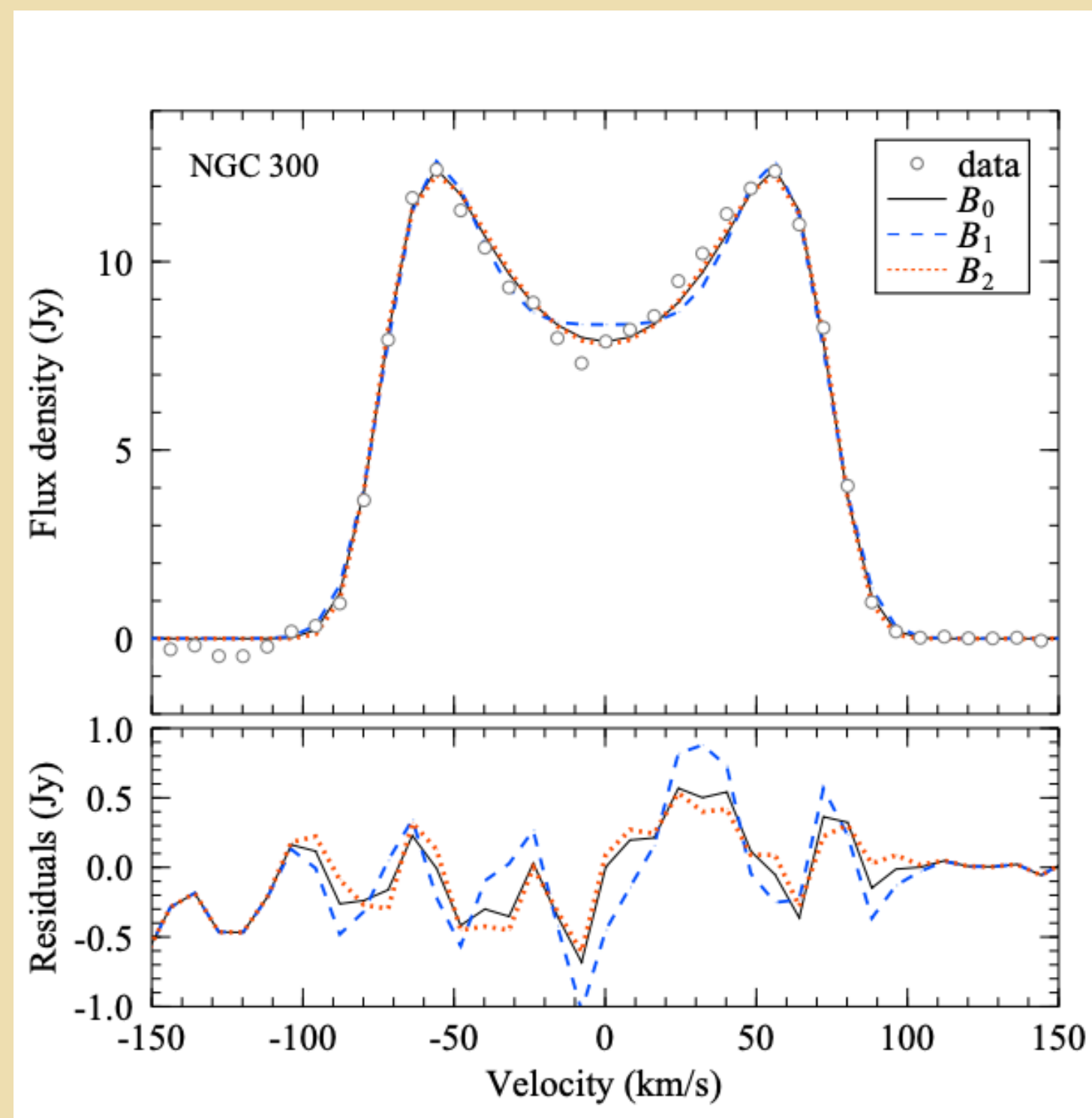
Westmeier et al.,
1311.5308



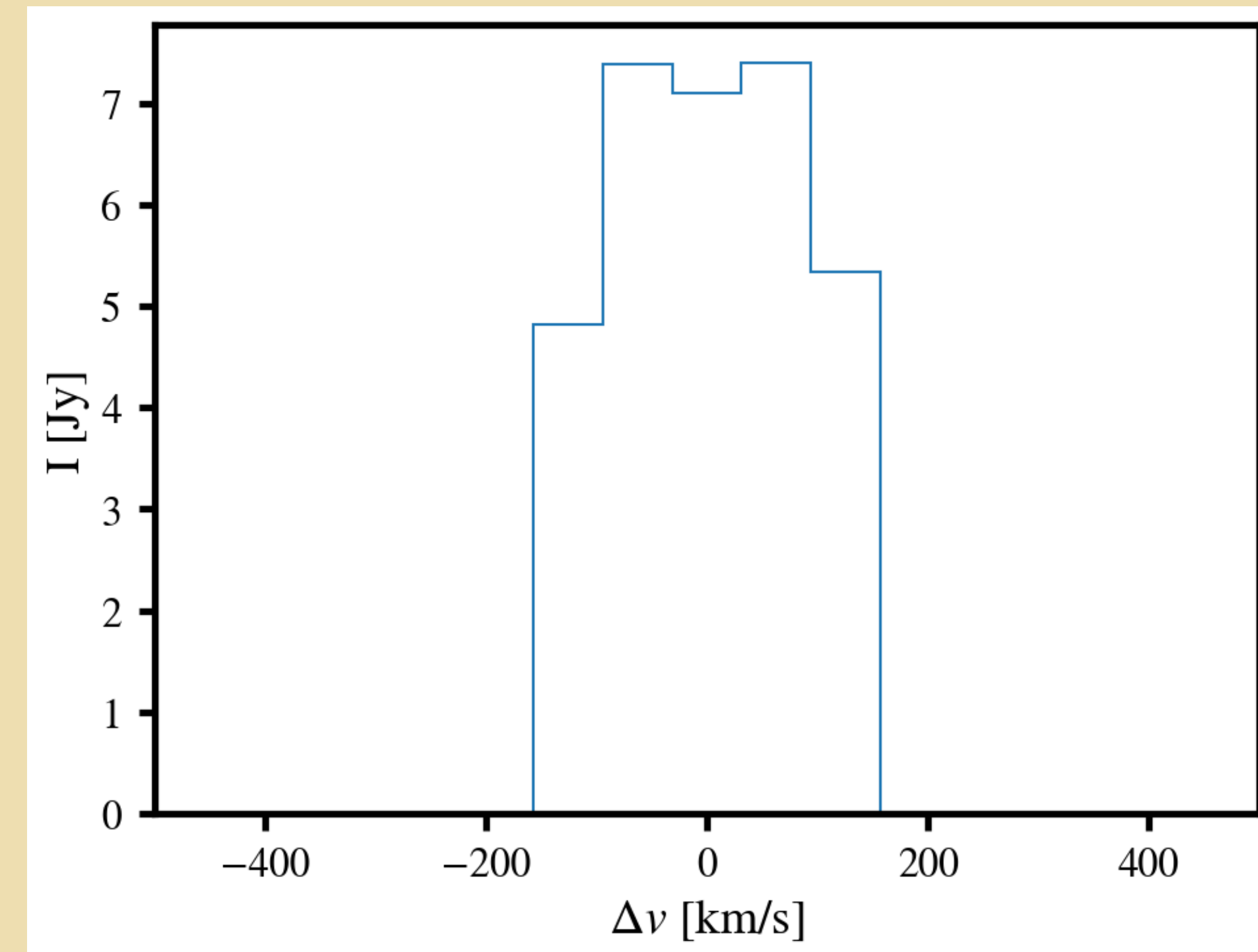
The emission line profile of HI galaxy

- In 4k mode, the MeerKAT L-band receiver has a velocity resolution of $\sim 50\text{km/s}$ at $z\sim 0$ ($\sim 65\text{km/s}$ at $z\sim 0.4$).

Westmeier et al.,
1311.5308



* Illustrative



An ideal stacking for single dish IM

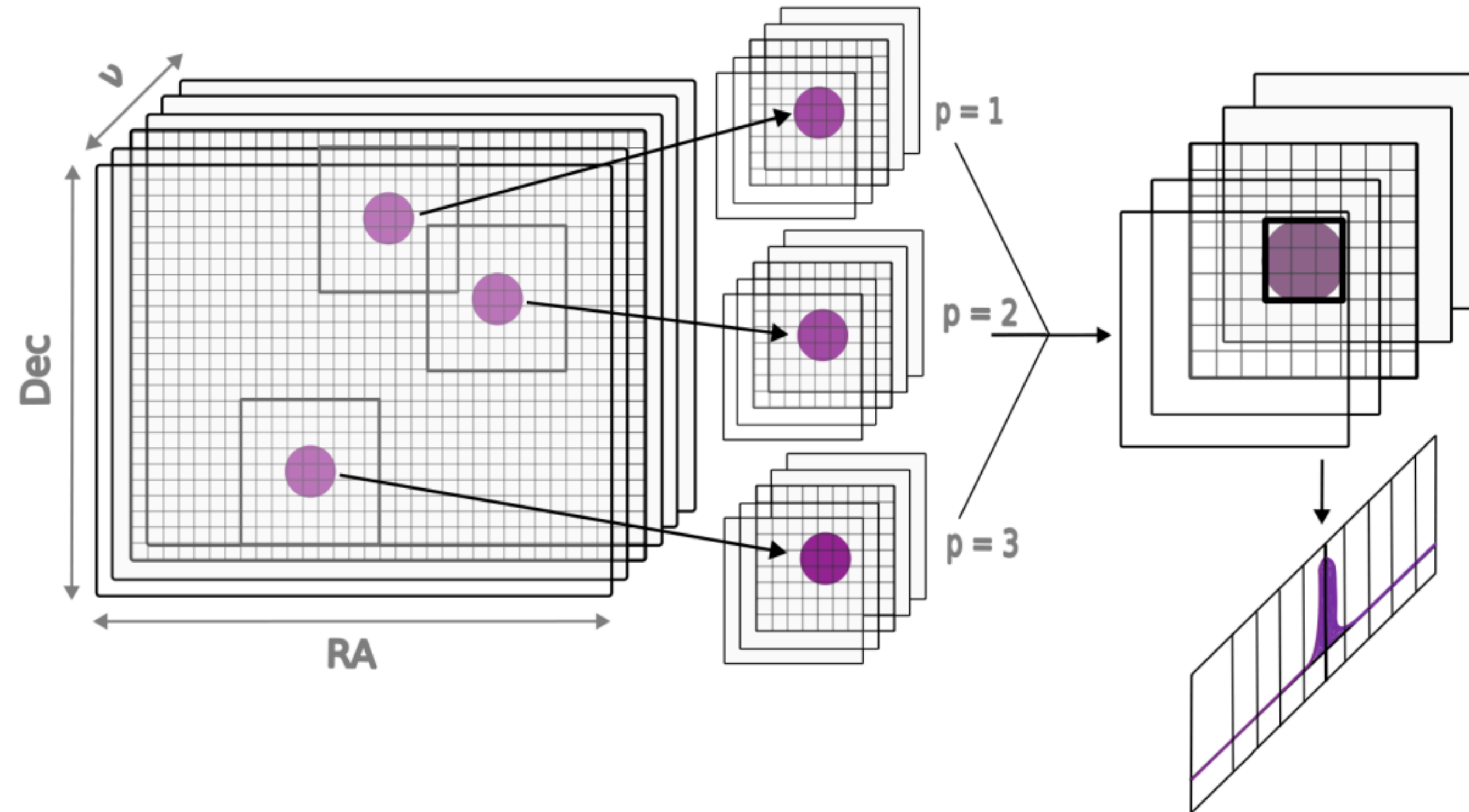
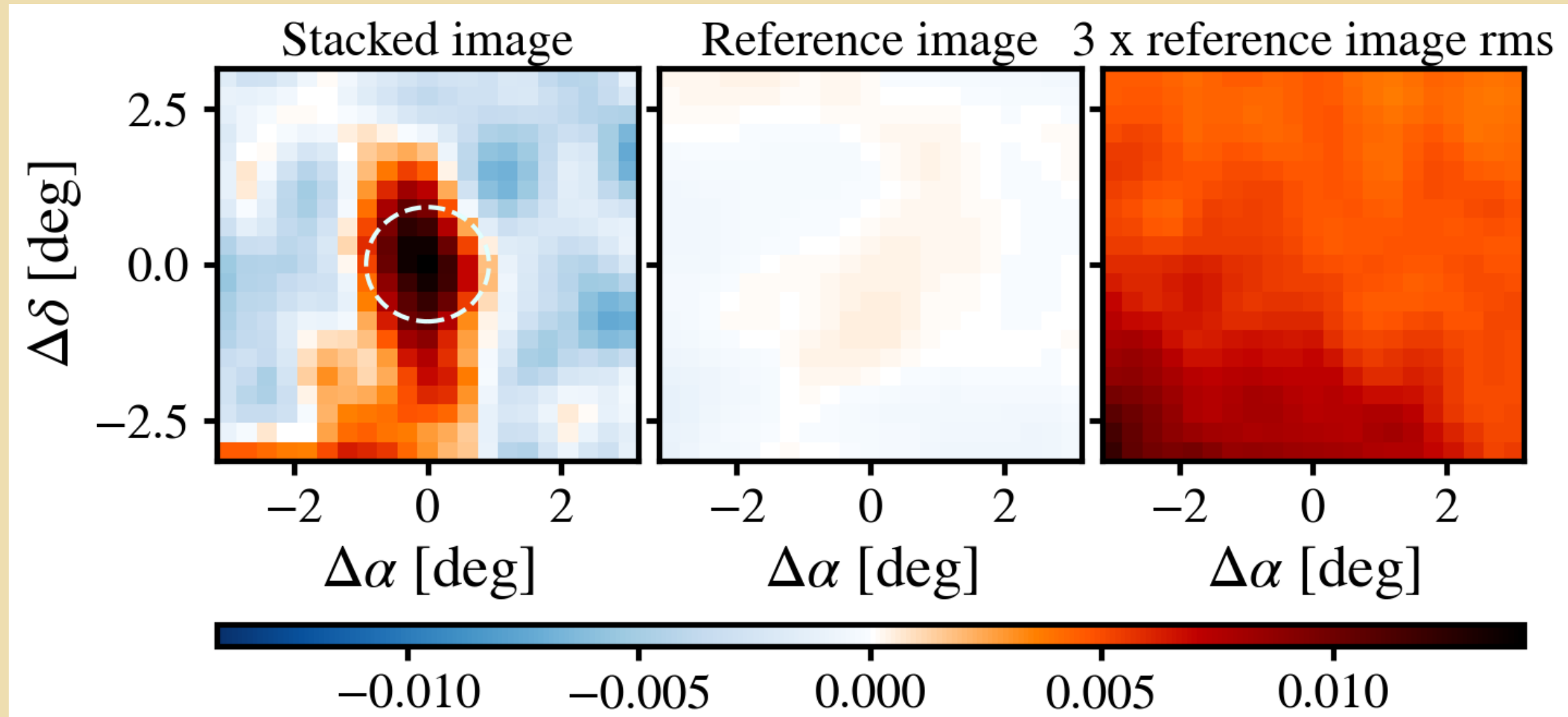


Figure 3. A diagram displaying the methodology used for this stacking analysis. From the full three-dimensional COMAP data cube (left), smaller 3-D cubelets are cut out centered on the position of each eBOSS object (center). These cubelets are then averaged into a single 3-D stack (top right), which is used to determine the average COMAP spectrum of the eBOSS objects (bottom right).

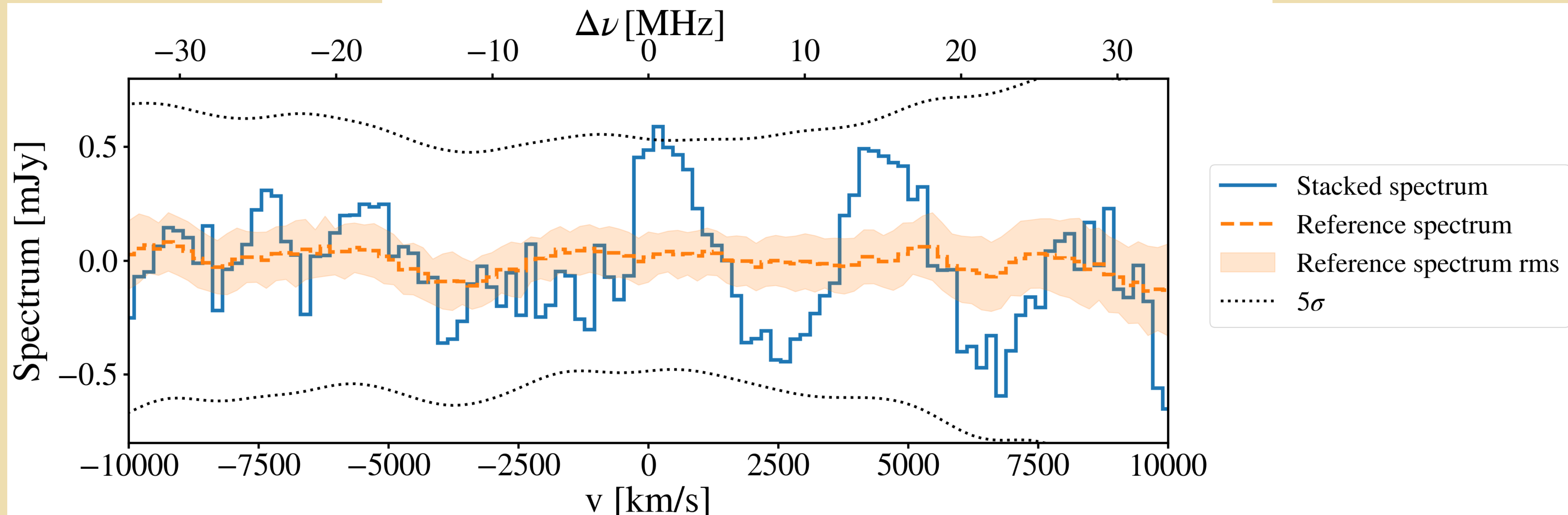
The reality

~ 8 sigma

~ 6 sigma

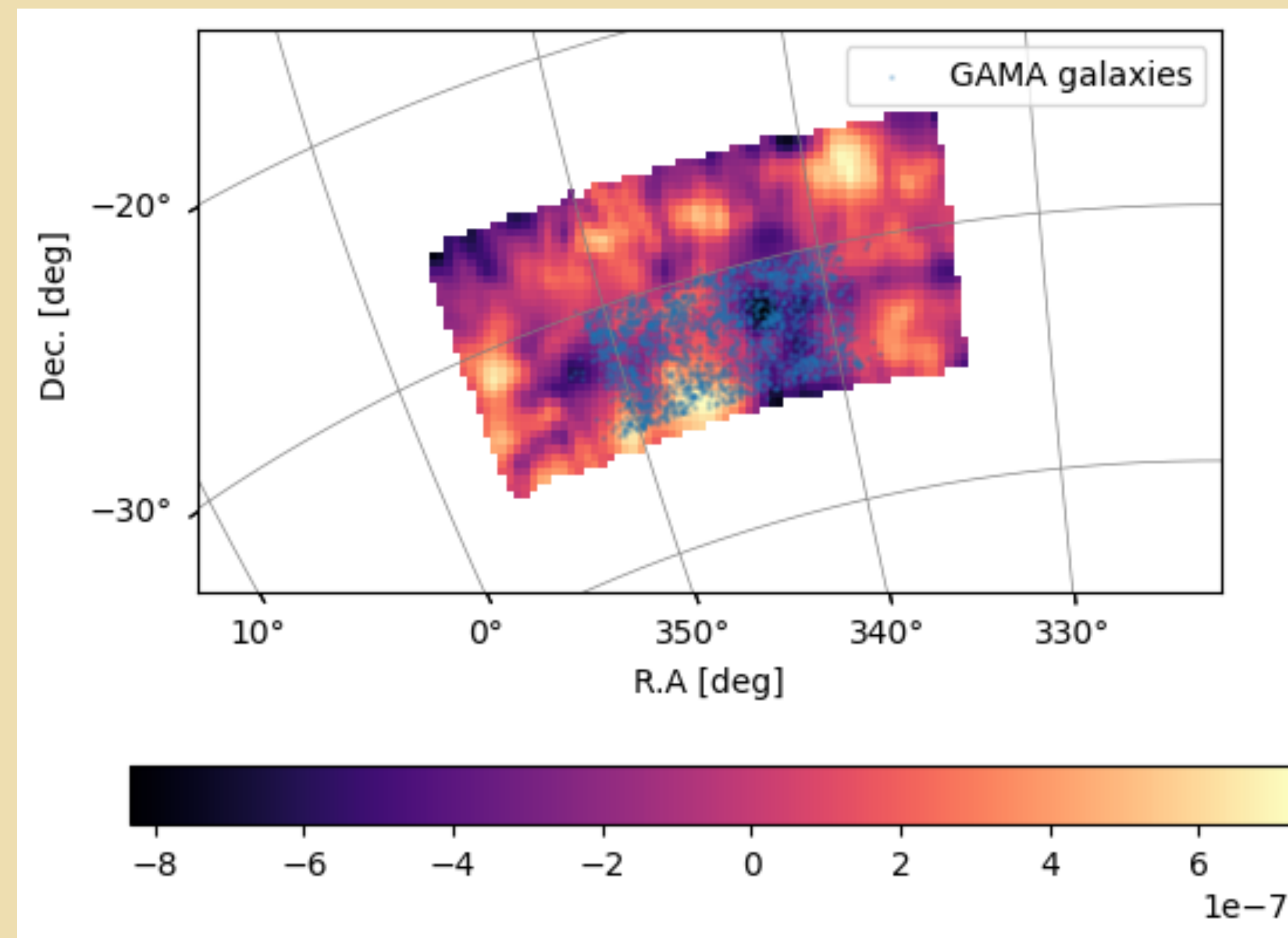


The MeerKLASS collbortion,
[2407.21626](#)



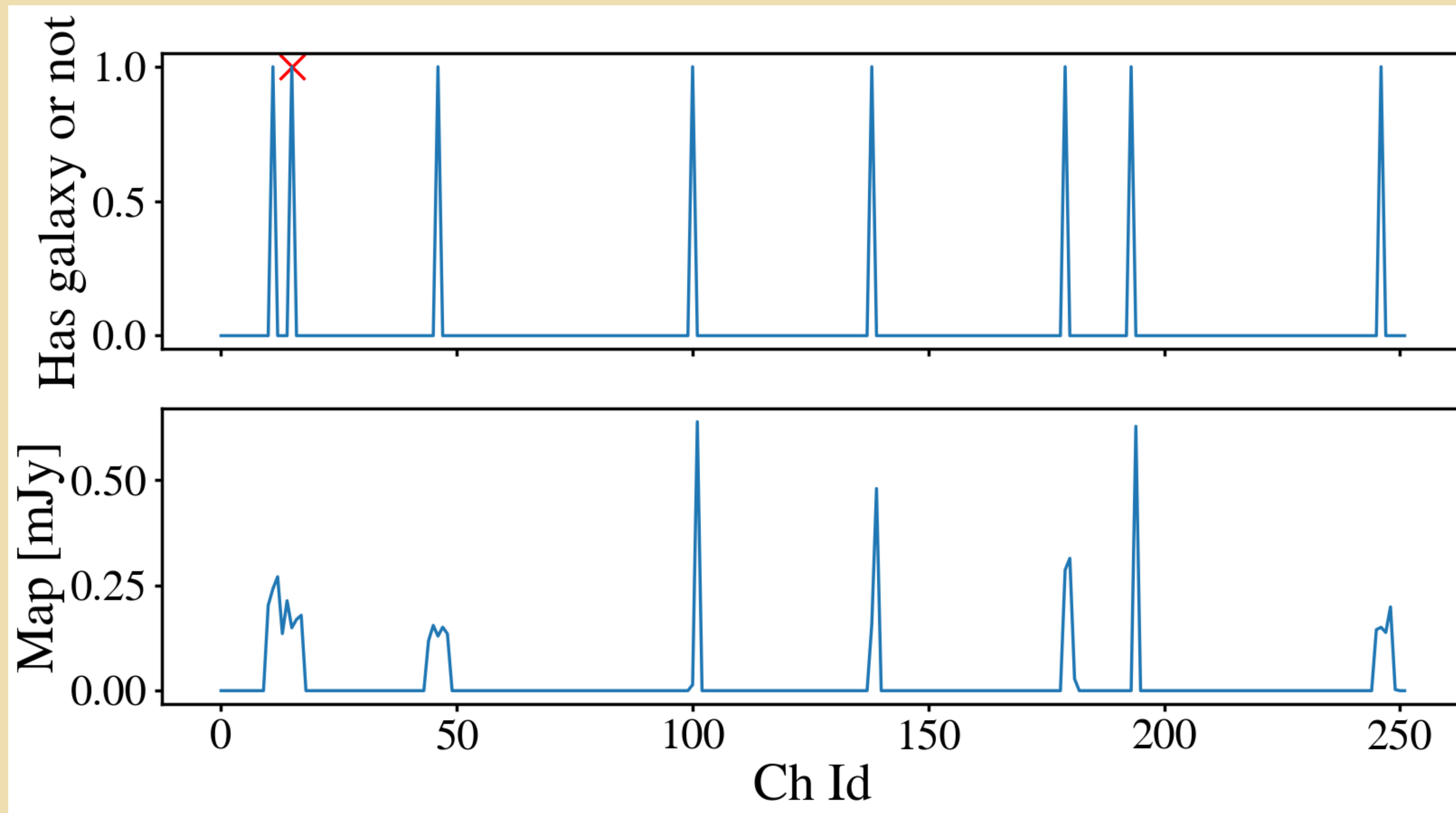
Problem 1: Too many galaxies, too few pixels

- In our data (L-band deep-field x GAMA galaxies), the area covered is only ~ 60 sqdeg with 2269 galaxies, resulting in ~ 40 galaxies per sqdeg. The MeerKAT beam is ~ 1 deg and our scanning strategy produces maps with 0.3 deg size pixel.



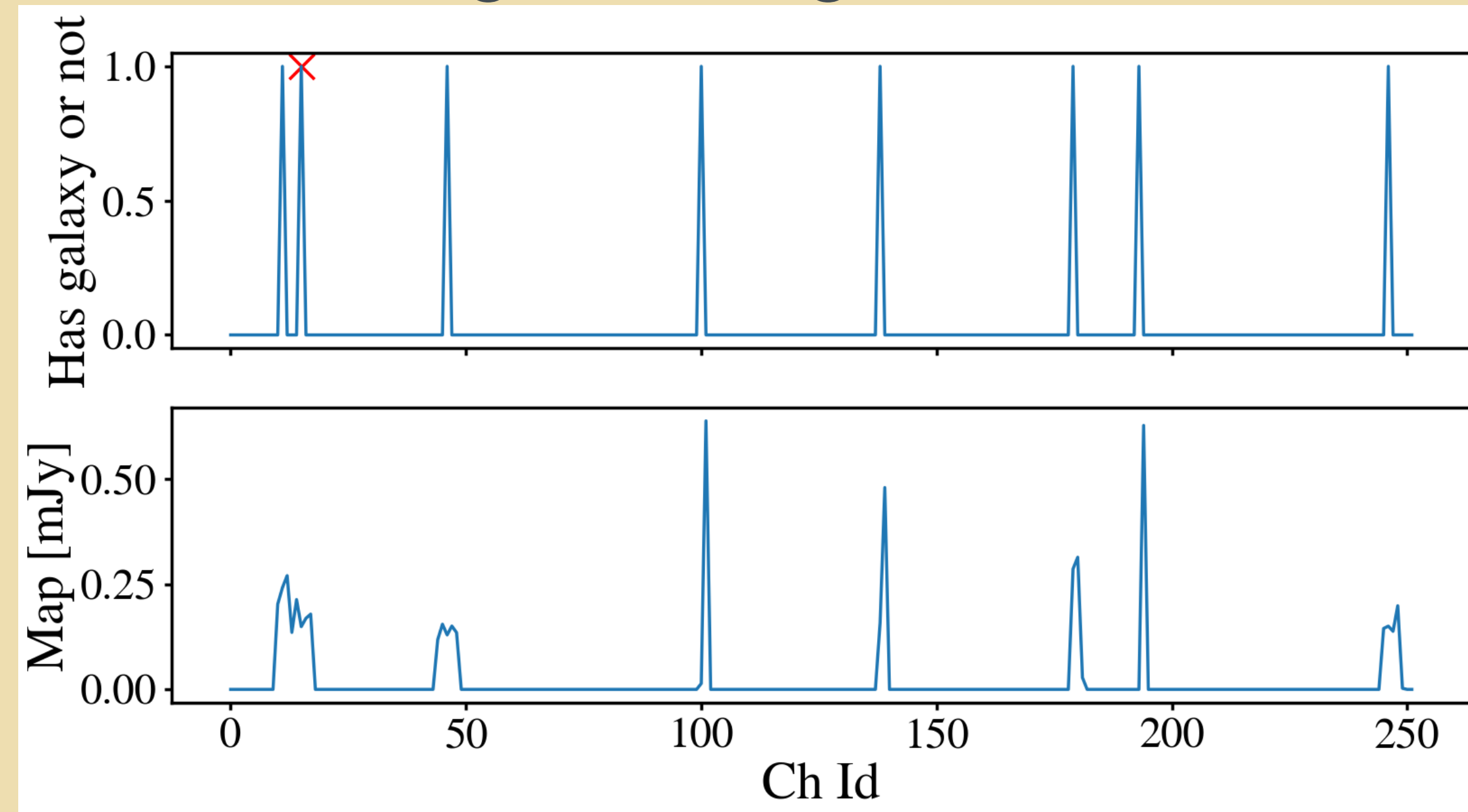
Problem 1: Too many galaxies, too few pixels

- Even without considering the beam, along the line-of-sight of a map pixel there are multiple galaxies.

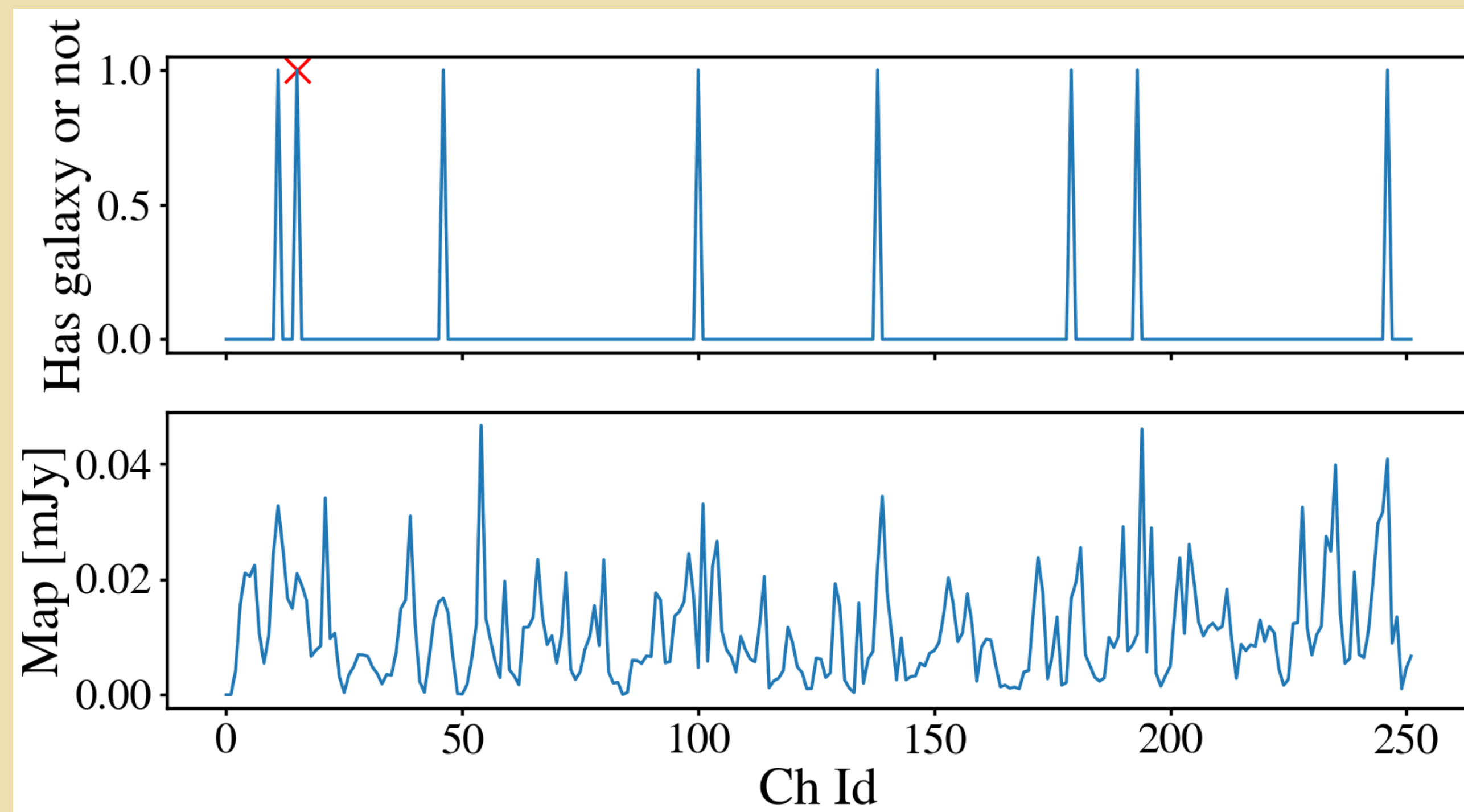


Problem 2: Scattering by the beam

- Including the 1deg beam then further creates double counting in angular space:



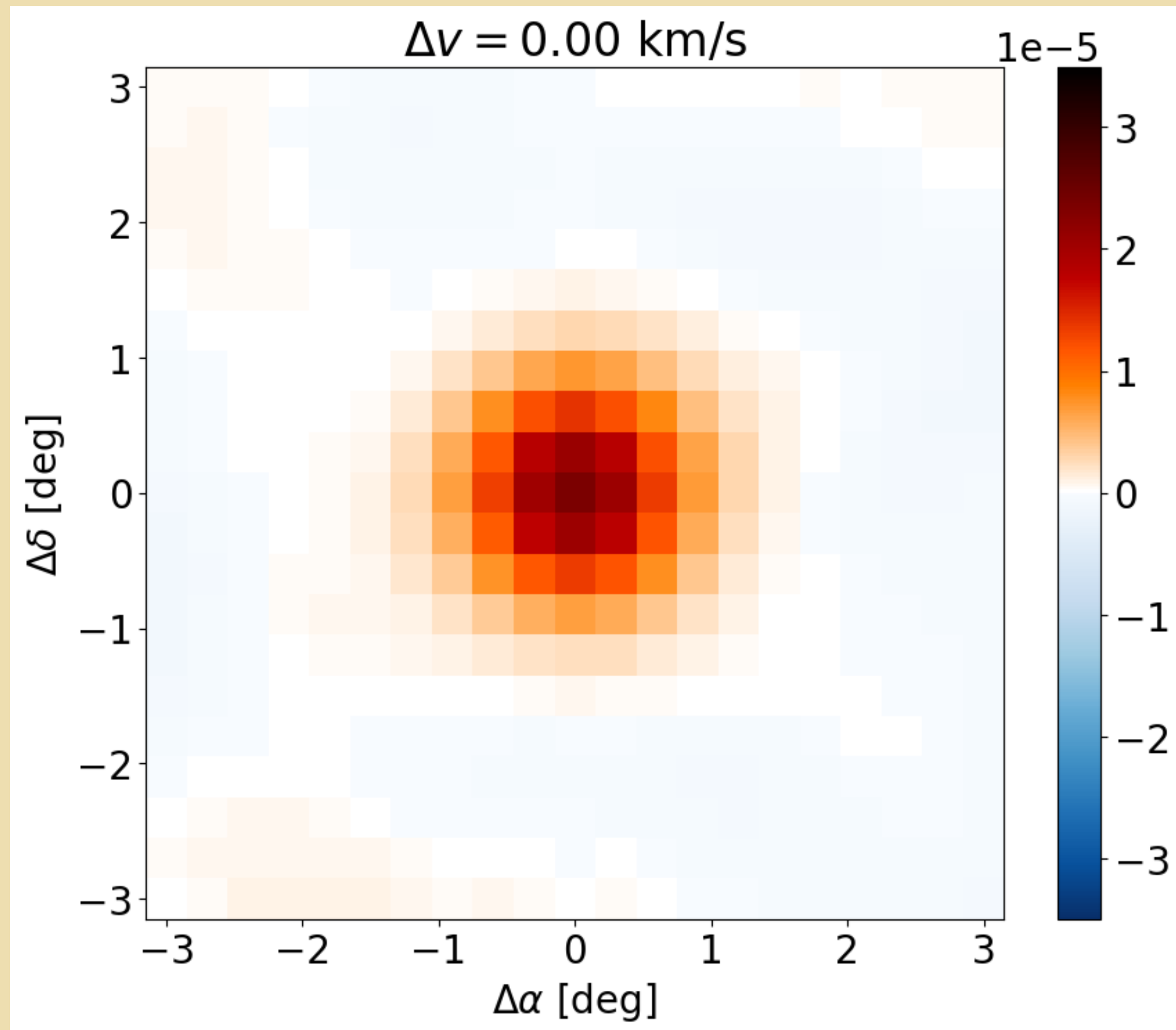
With Beam



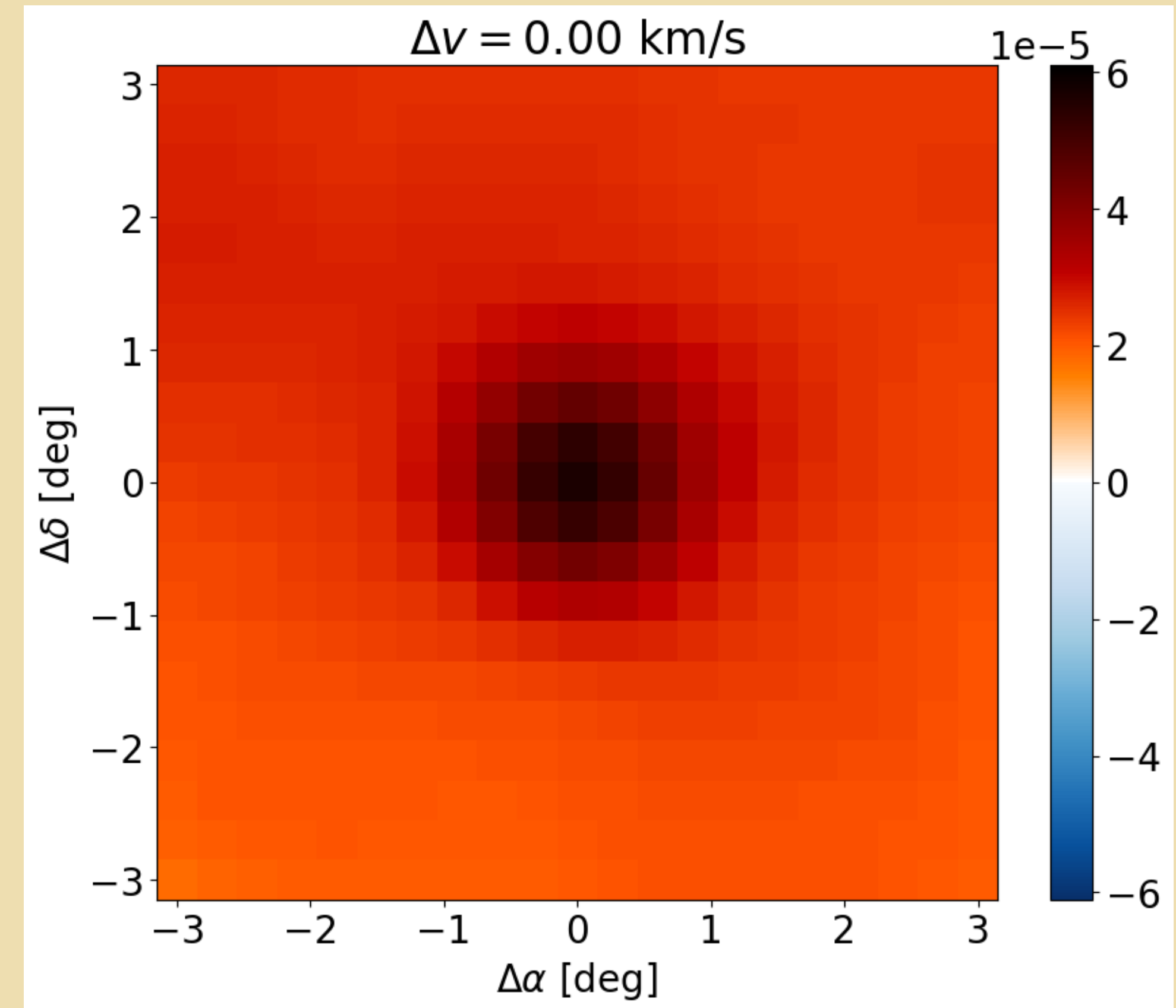
Problem 2: Scattering by the beam

- Including the 1deg beam then further creates double counting in angular space:

Ideal



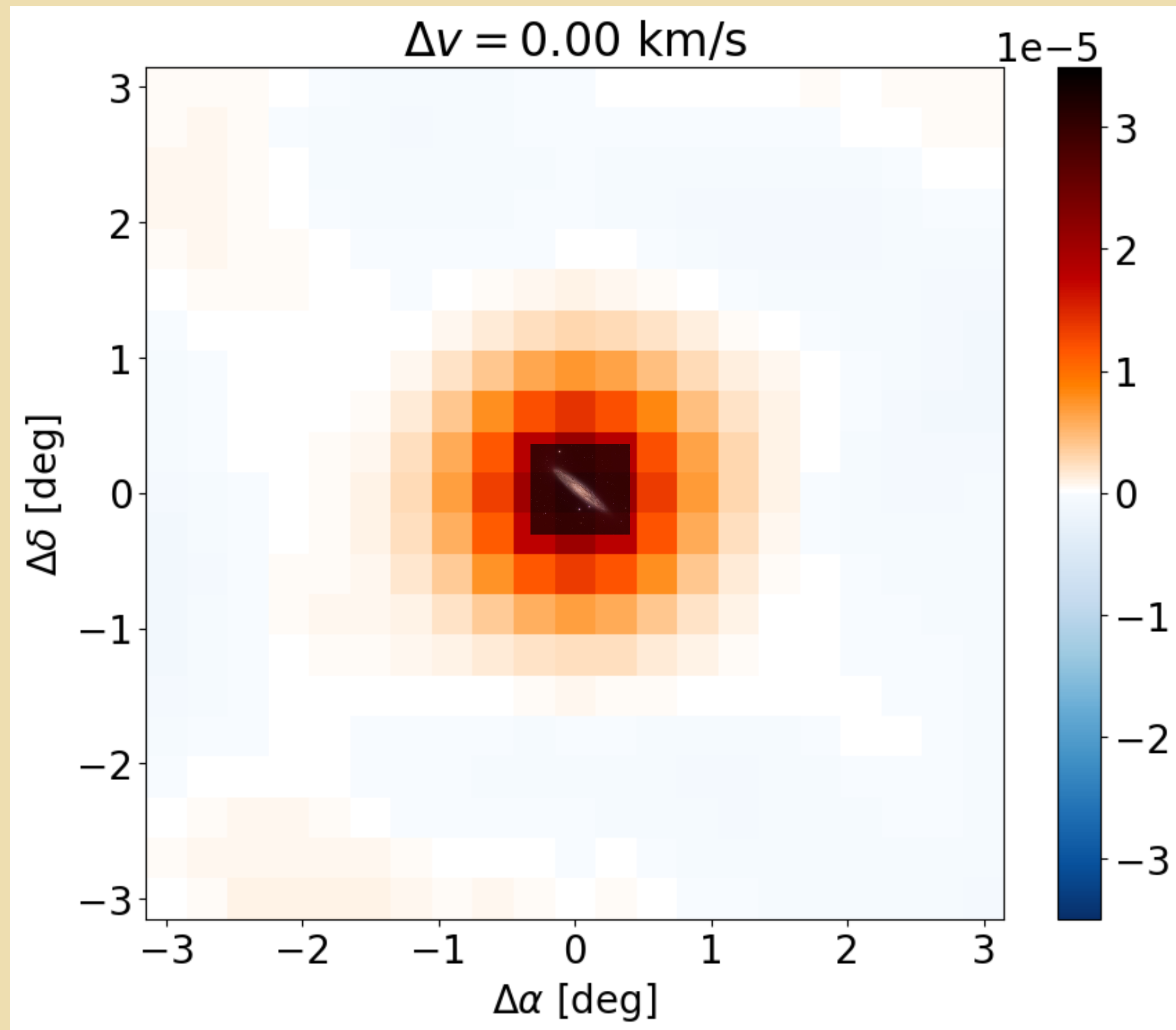
With double counting



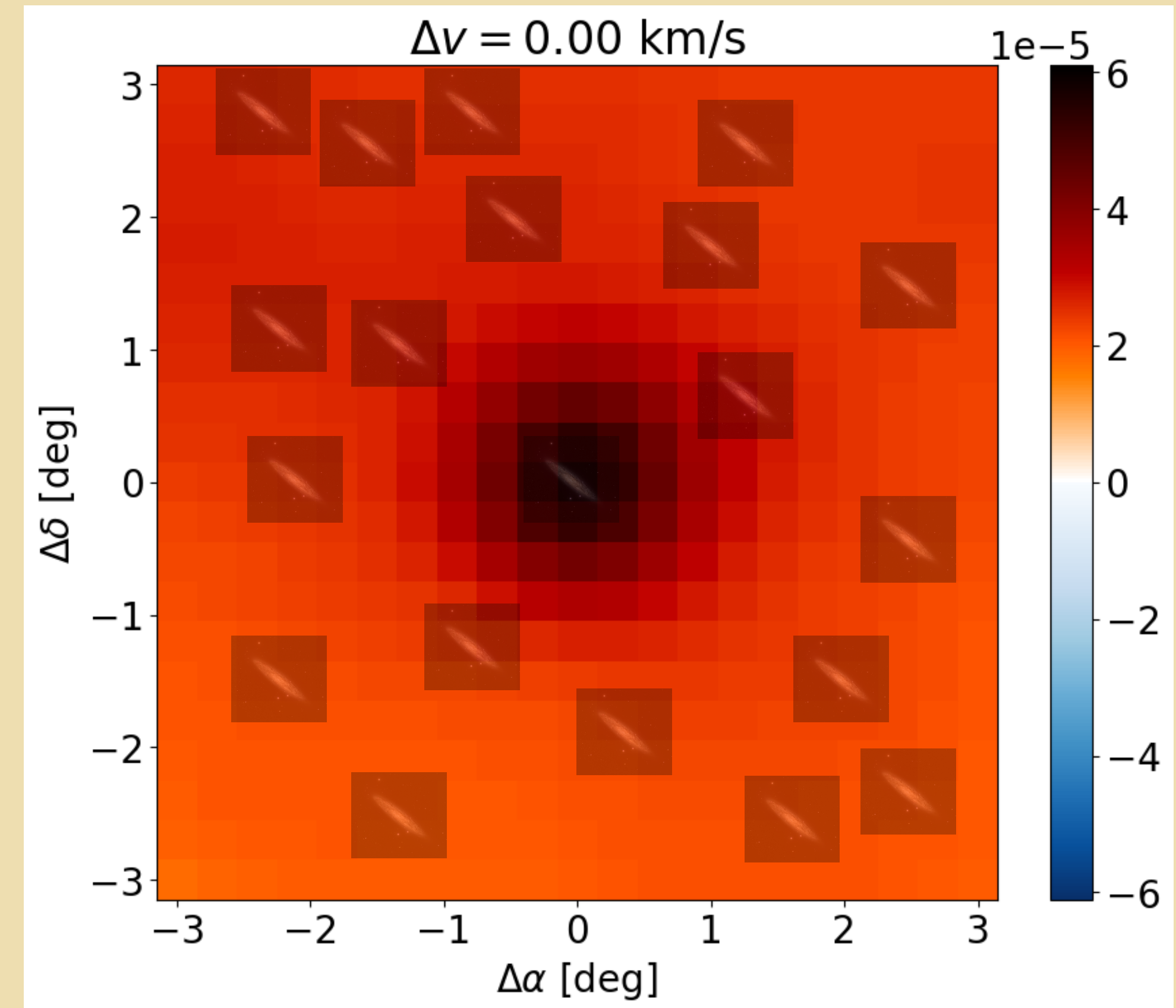
Problem 2: Scattering by the beam

- Including the 1deg beam then further creates double counting in angular space:

Ideal

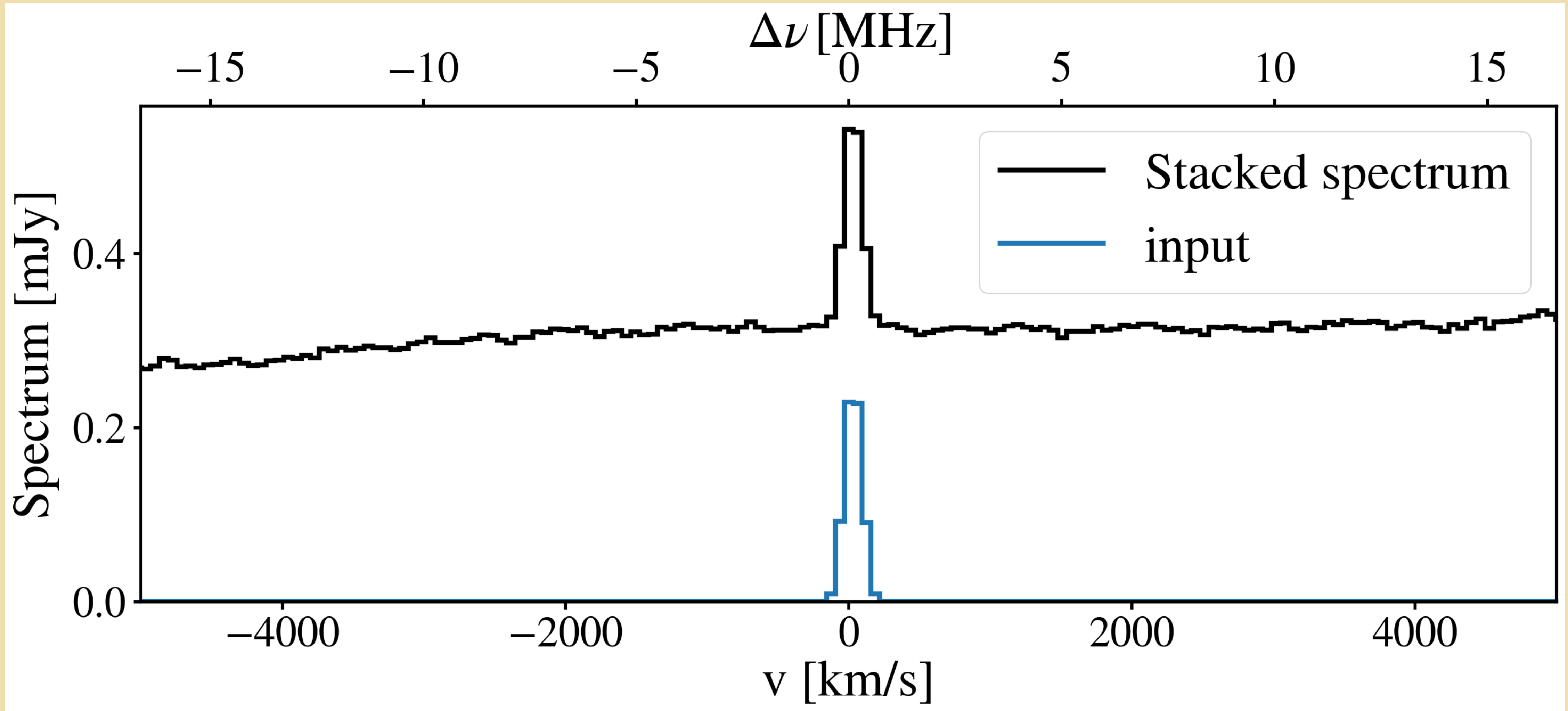


With double counting



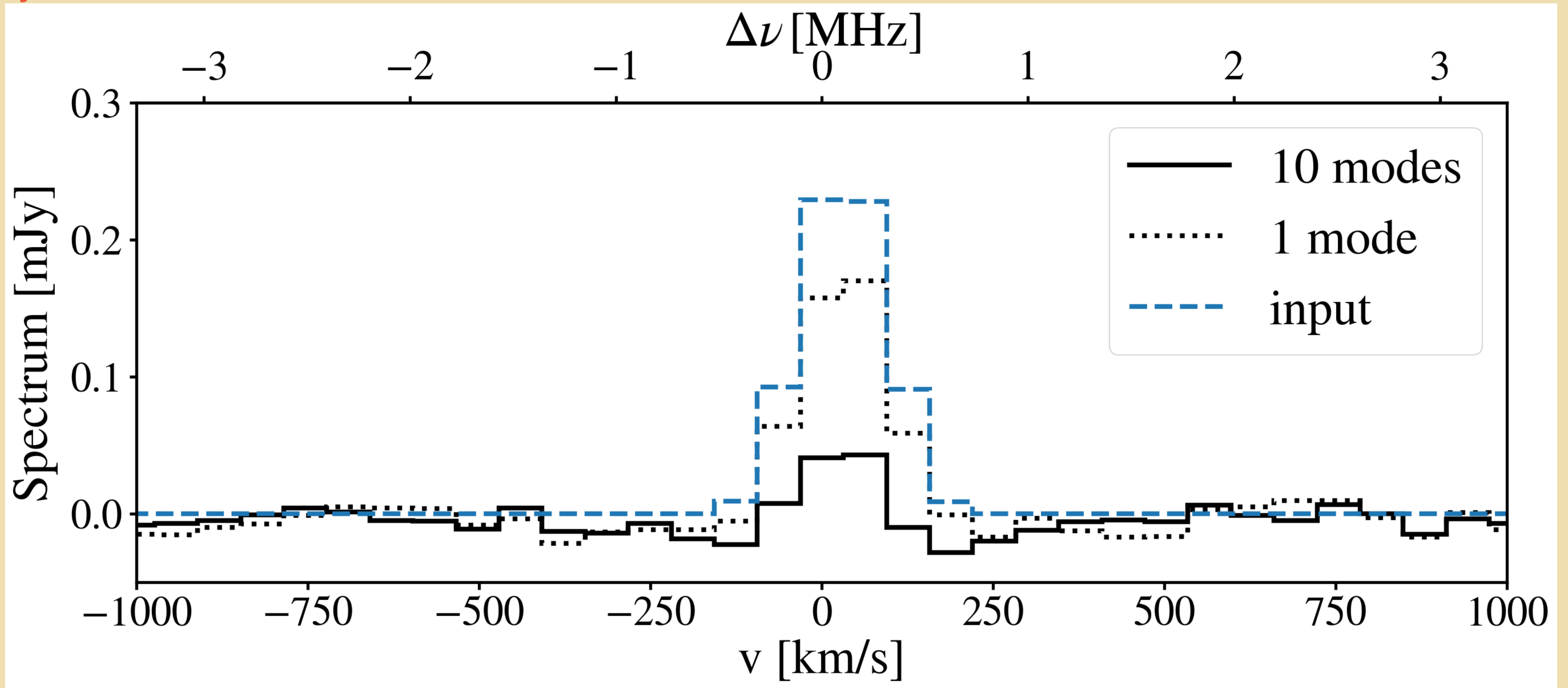
Problem 2: Scattering by the beam

- The double-counting of galaxies effectively creates a plateau:



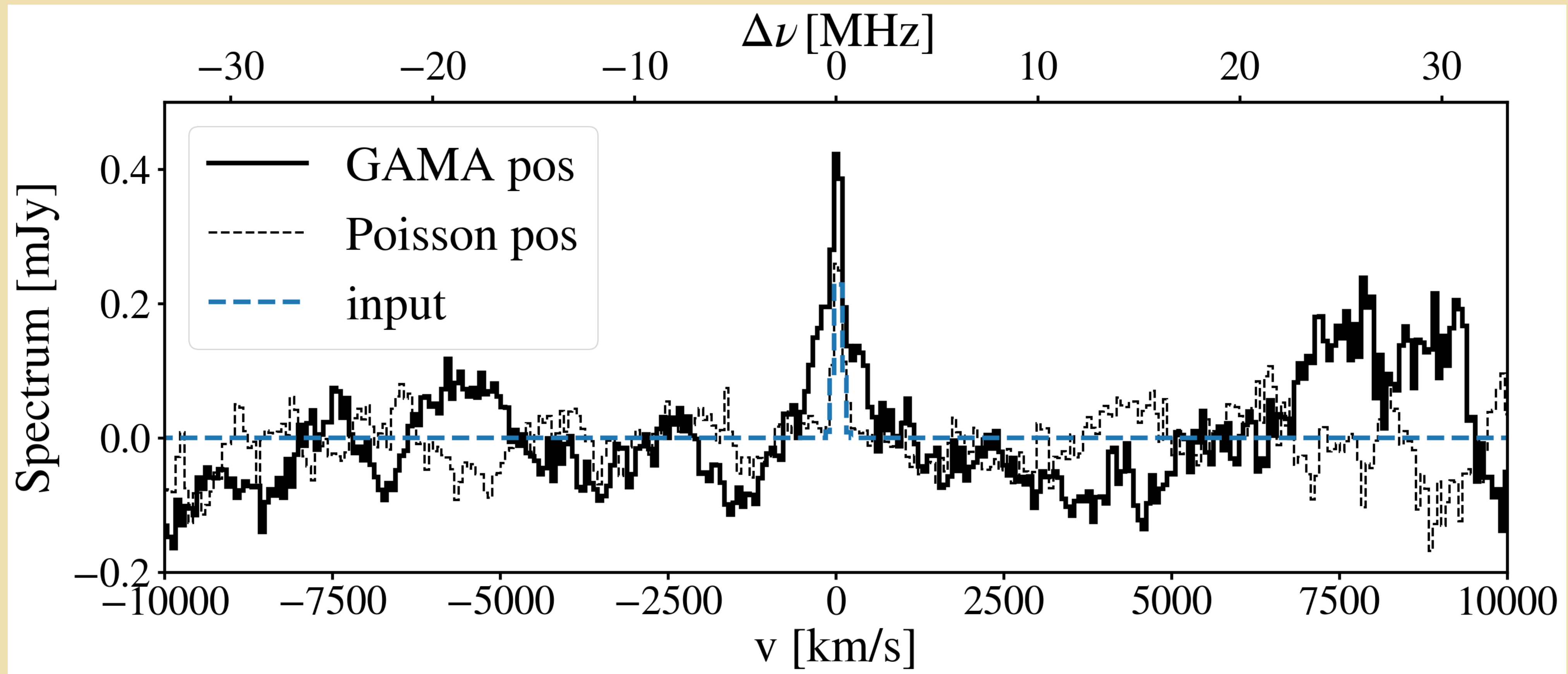
Solution: good ol' PCA

- PCA removes the plateau at the expenses of **signal loss** and effects from **residual systematics**



Problem 3: Clustering amplification of signal

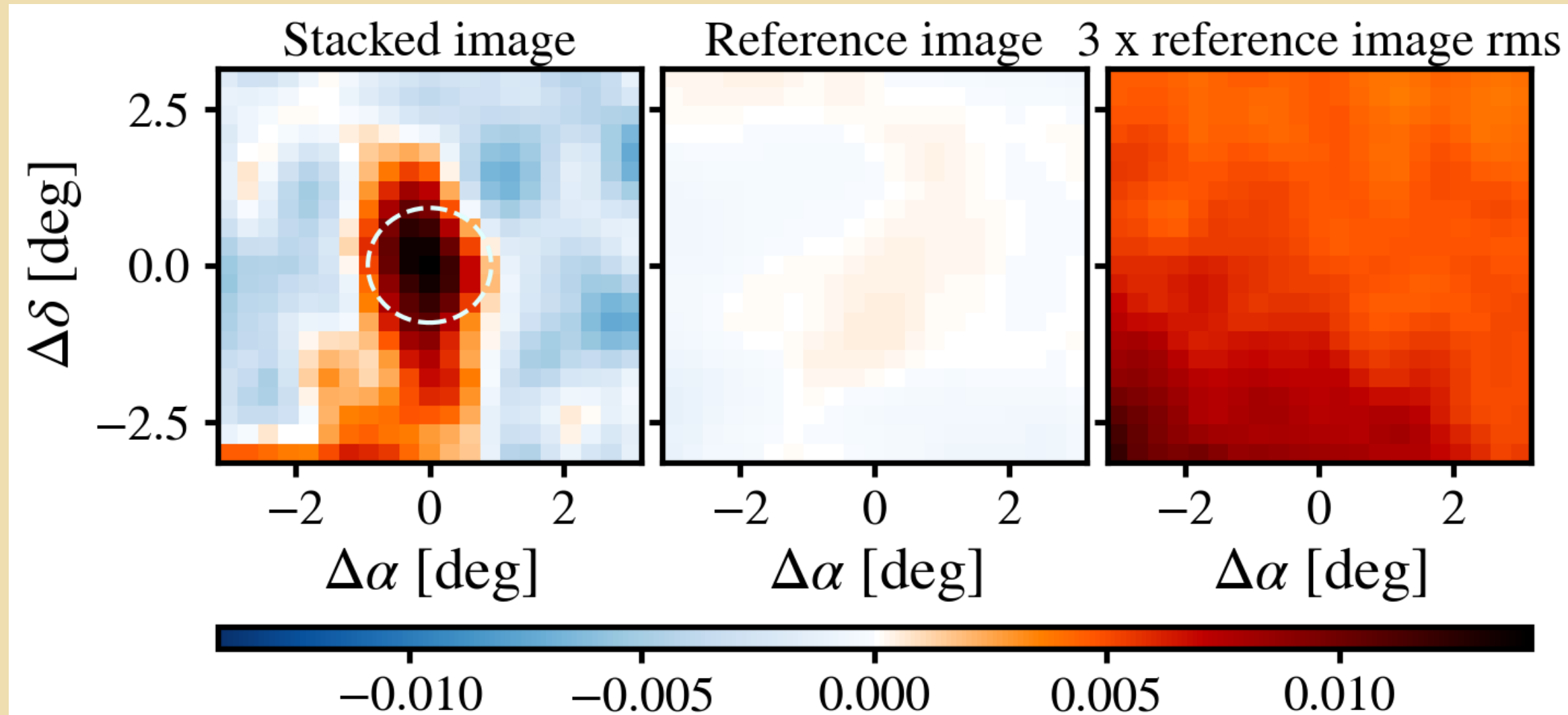
- Including the ~ 1 deg beam corresponds to ~ 15 Mpc scale. The stacked signal includes a clustering component.
- Requires **forward modelling** of the signal.



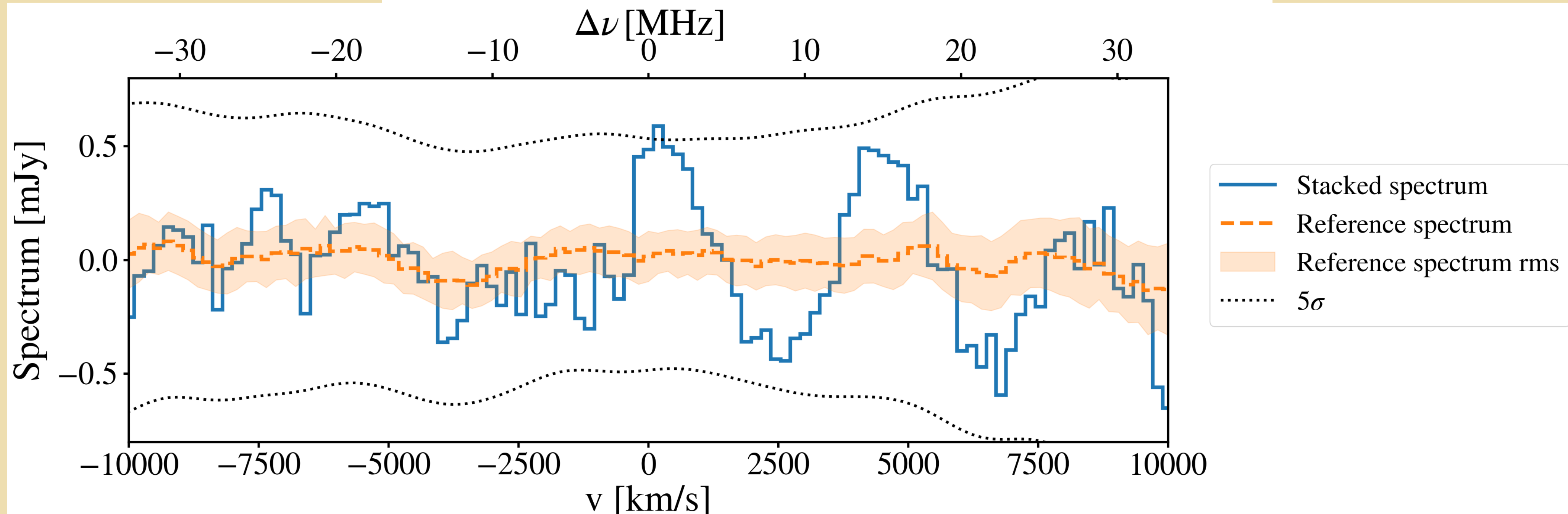
Problem 4: real map has residual systematics

~ 8 sigma

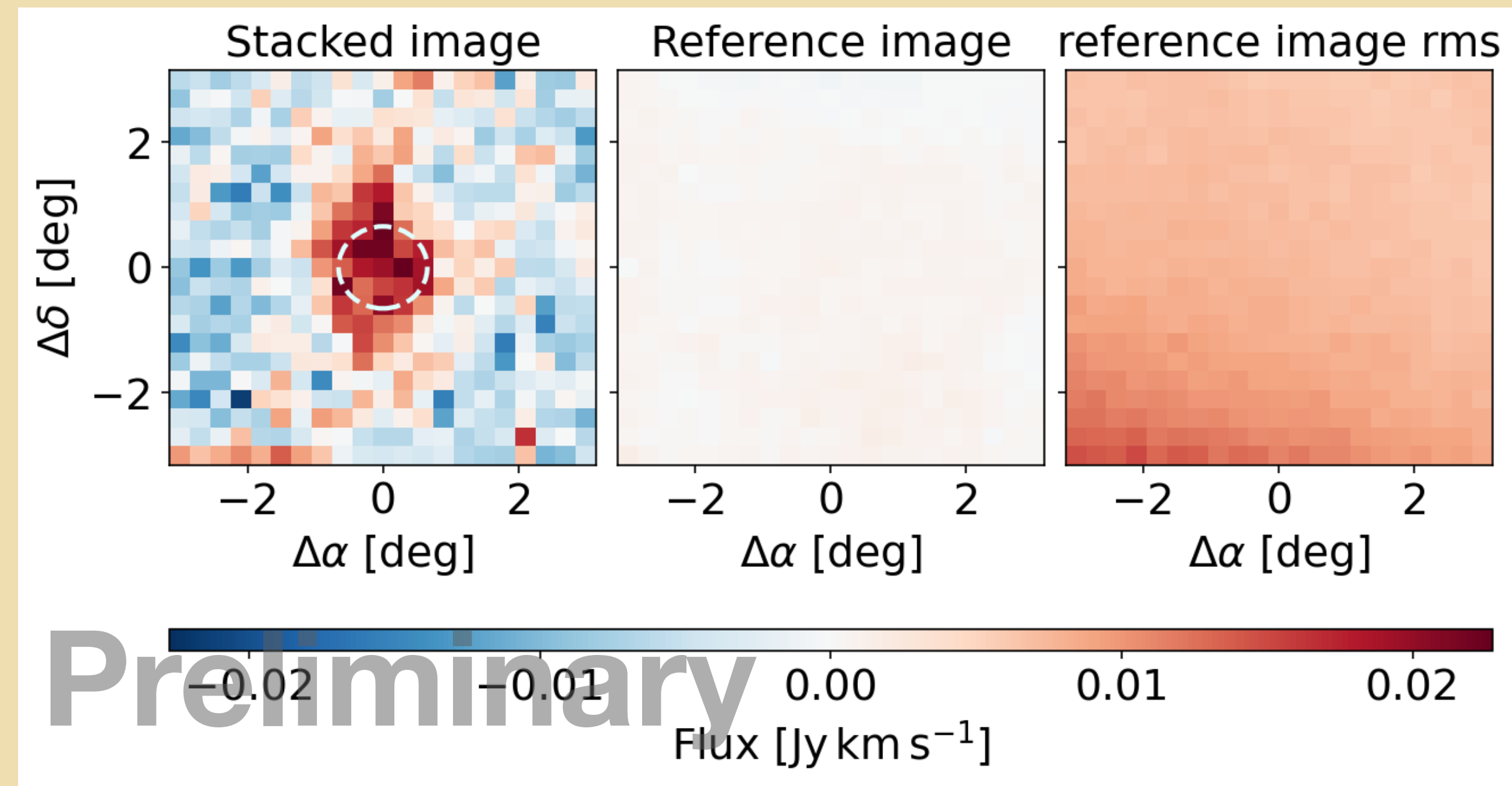
~ 6 sigma



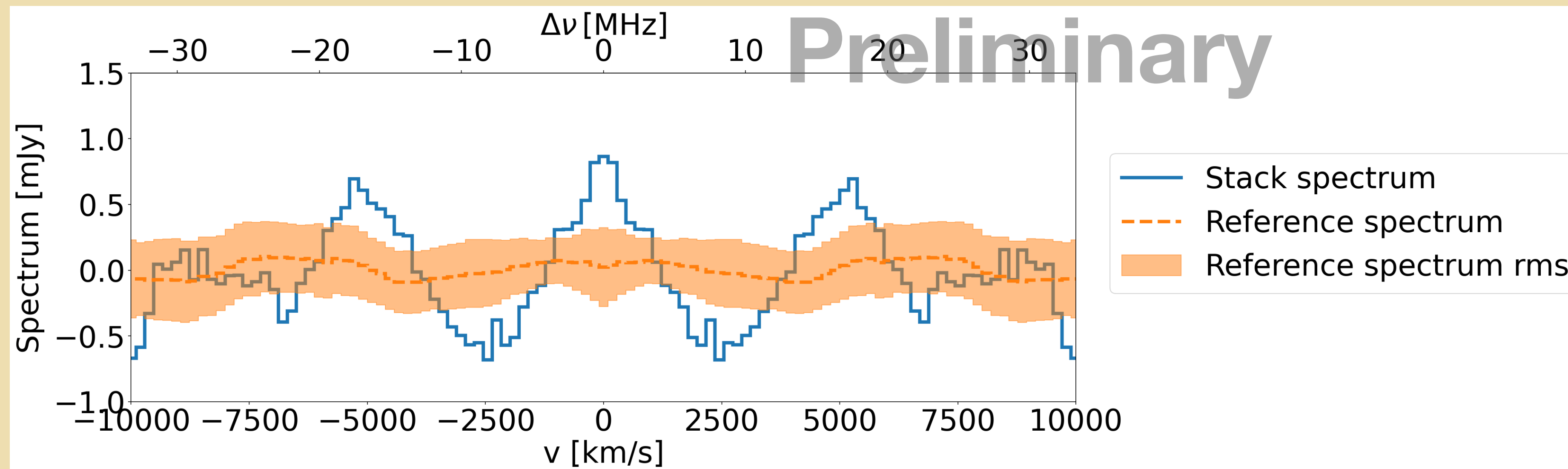
The MeerKLASS collbation,
[2407.21626](https://doi.org/10.21626)



Problem 4: real map has residual systematics



Z. Chen,
The MeerKLASS collbation, in
prep

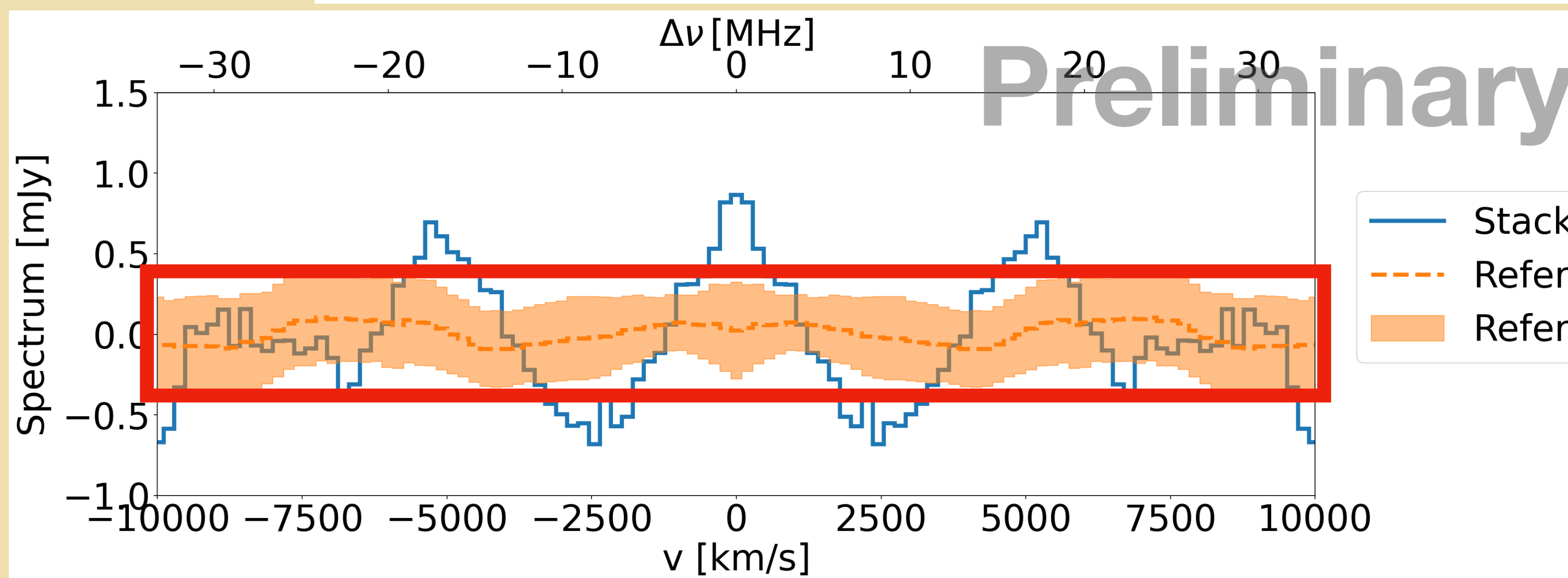
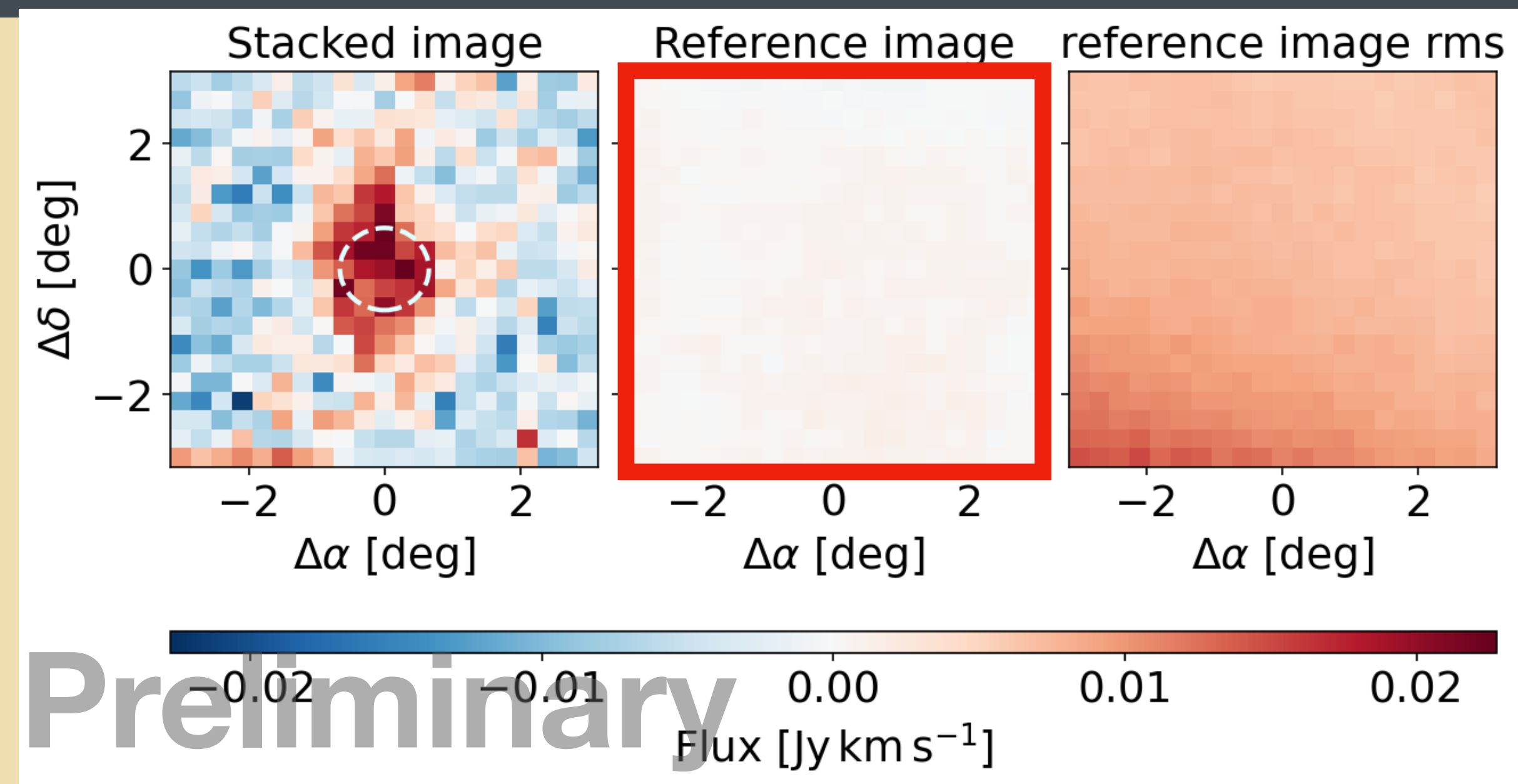


Understanding the systematics

	21cm IM	GC/WL
Additive Systematics	RFI, residual foregrounds ...	Interloper ...
Multiplicative systematics	Calibration errors ...	Source confusion ...
Convolutional systematics	Beam chromaticity ...	PSF ...

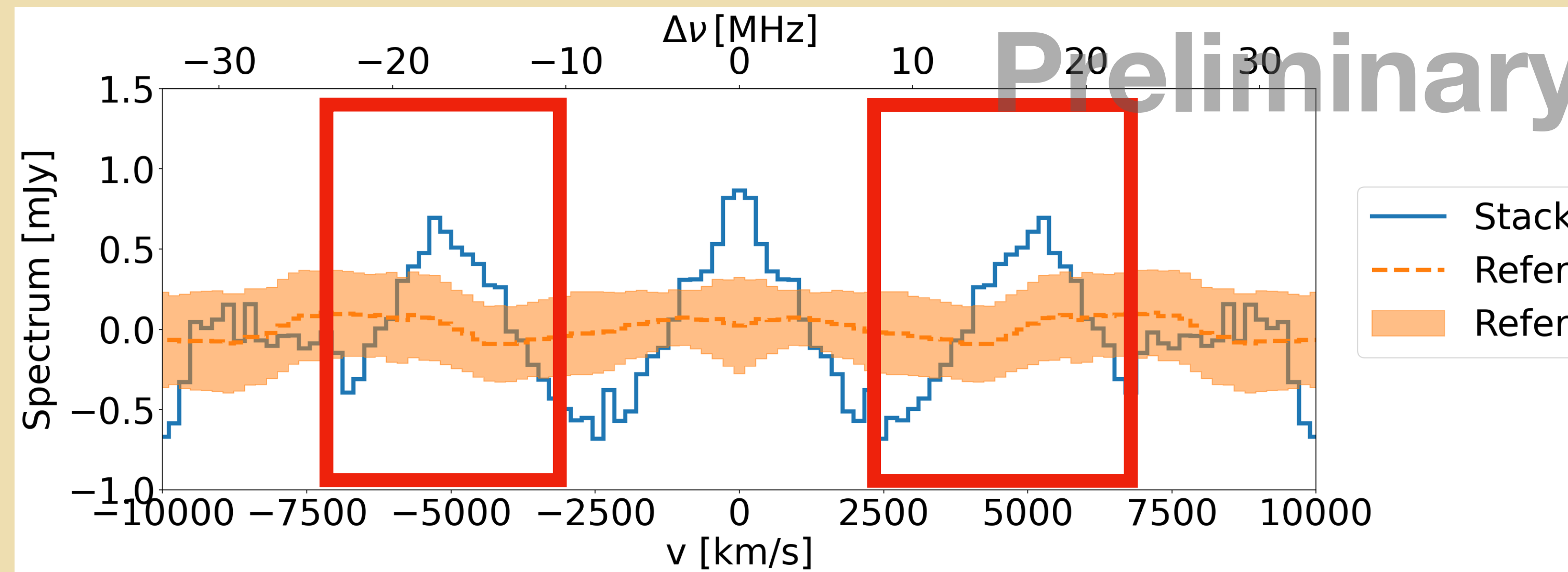
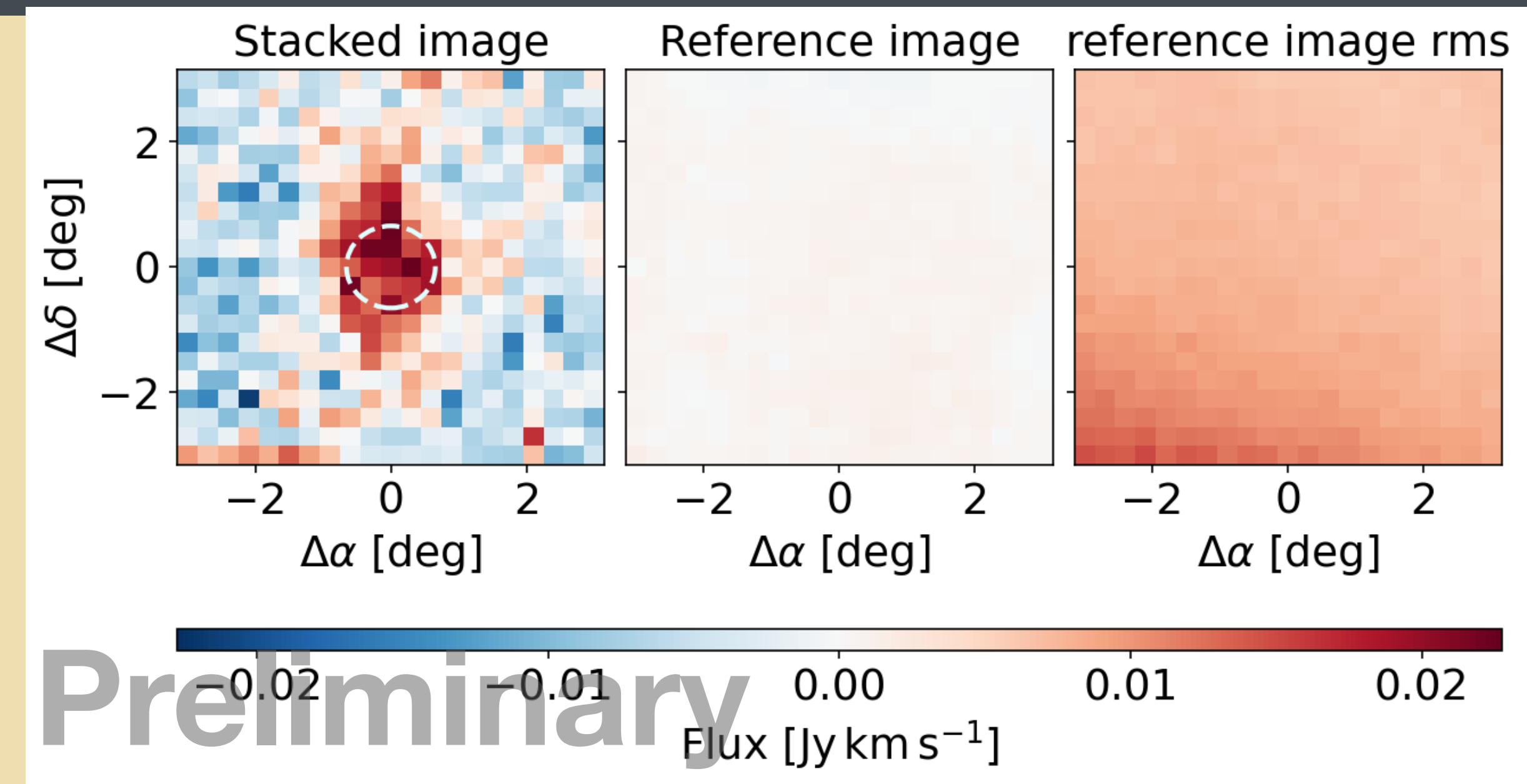
Hunting down the source of systematics

- The reference image and spectrum are calculated by randomly shuffling galaxy positions
- Consistent with zero
- The contamination is not an additional component of the map, but **distortion** of the HI signal.



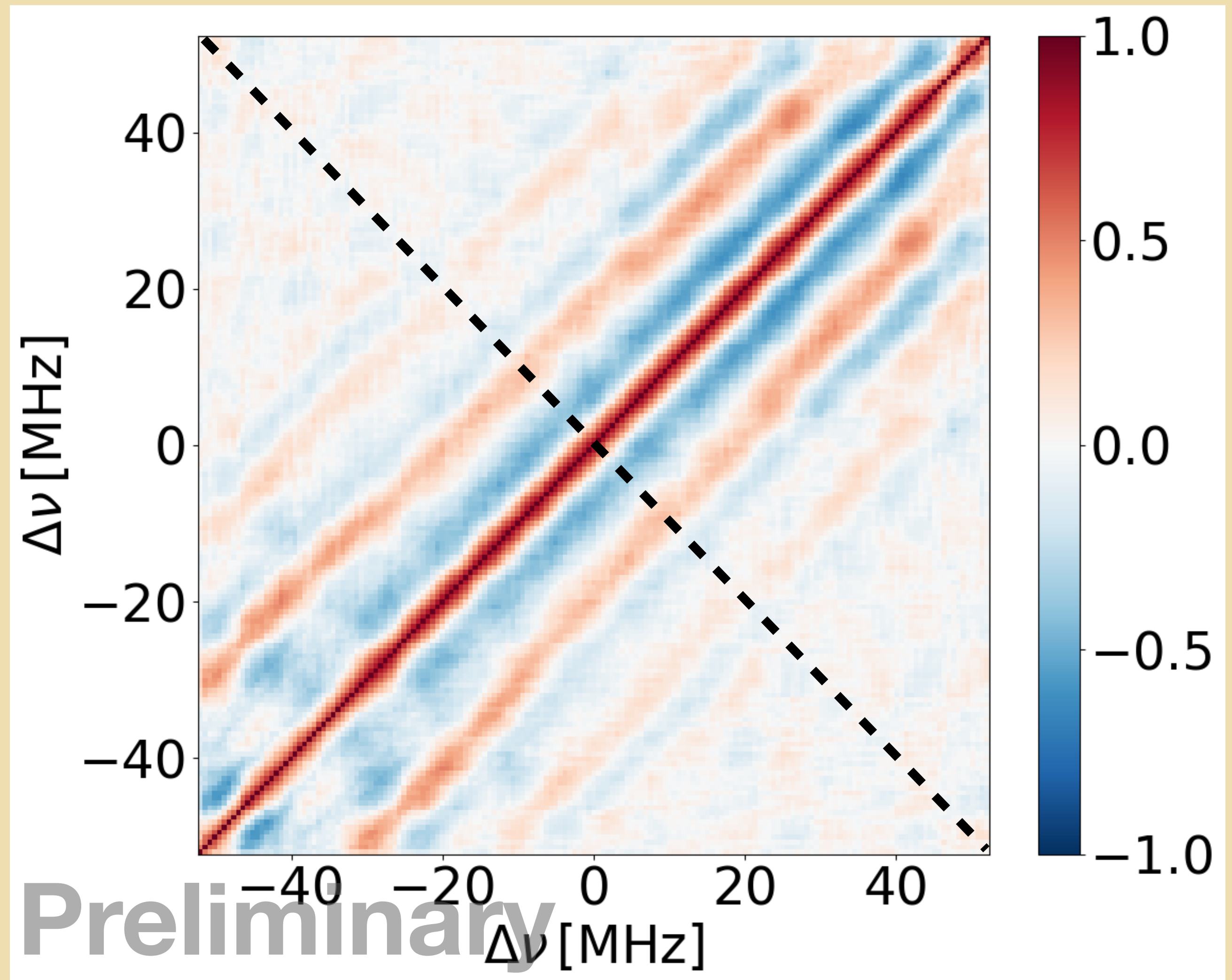
Hunting down the source of systematics

- There is an oscillating structure in frequency and no visible structure in angular space.
- Multiplicative or convolutional effects along the frequencies?



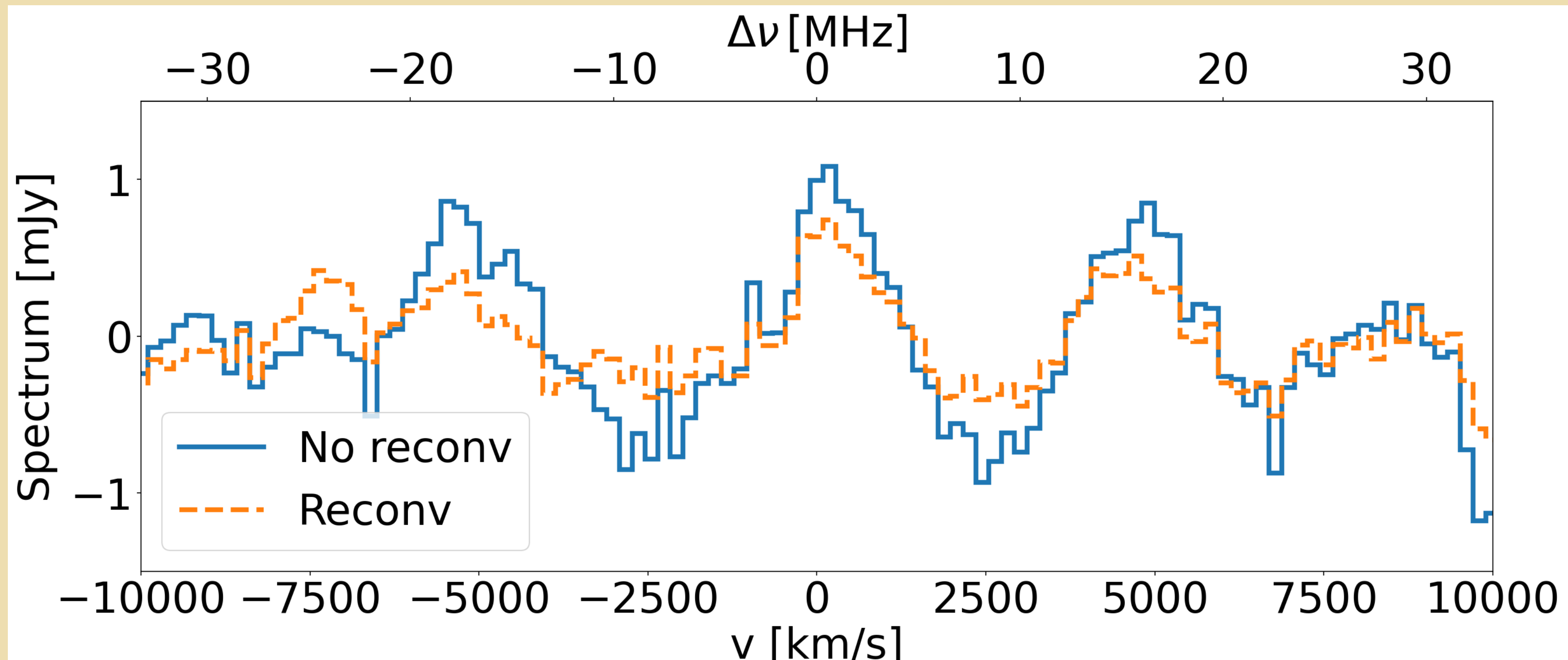
Hunting down the source of systematics

- Using the random shuffling, we can also calculate the covariance of the reference spectrum.
- The correlation matrix shows the oscillation as well
- Suggests that the systematic effect **convolves** with the signal



Hunting down the source of systematics

- In the L-band deep-field analysis, the maps at each frequency are reconvolved by a common Gaussian beam to a lower resolution.
- If the reconvolution is skipped, the oscillating structure is more visible and at a constant interval.
- The systematics is likely related to the **chromaticity of the instrument**



Hunting down the source of systematics

- The MeerKAT beam is known to have a **rippling** structure
- The period of the ripples is $\sim 20\text{MHz}$, matching the frequency scales of the systematics
- Known to cause effects in foreground cleaning for intensity mapping

Asad et al., [1904.07155](#)

Matshawule et al., [2011.10815](#)

Spinelli et al., [2107.10814](#)

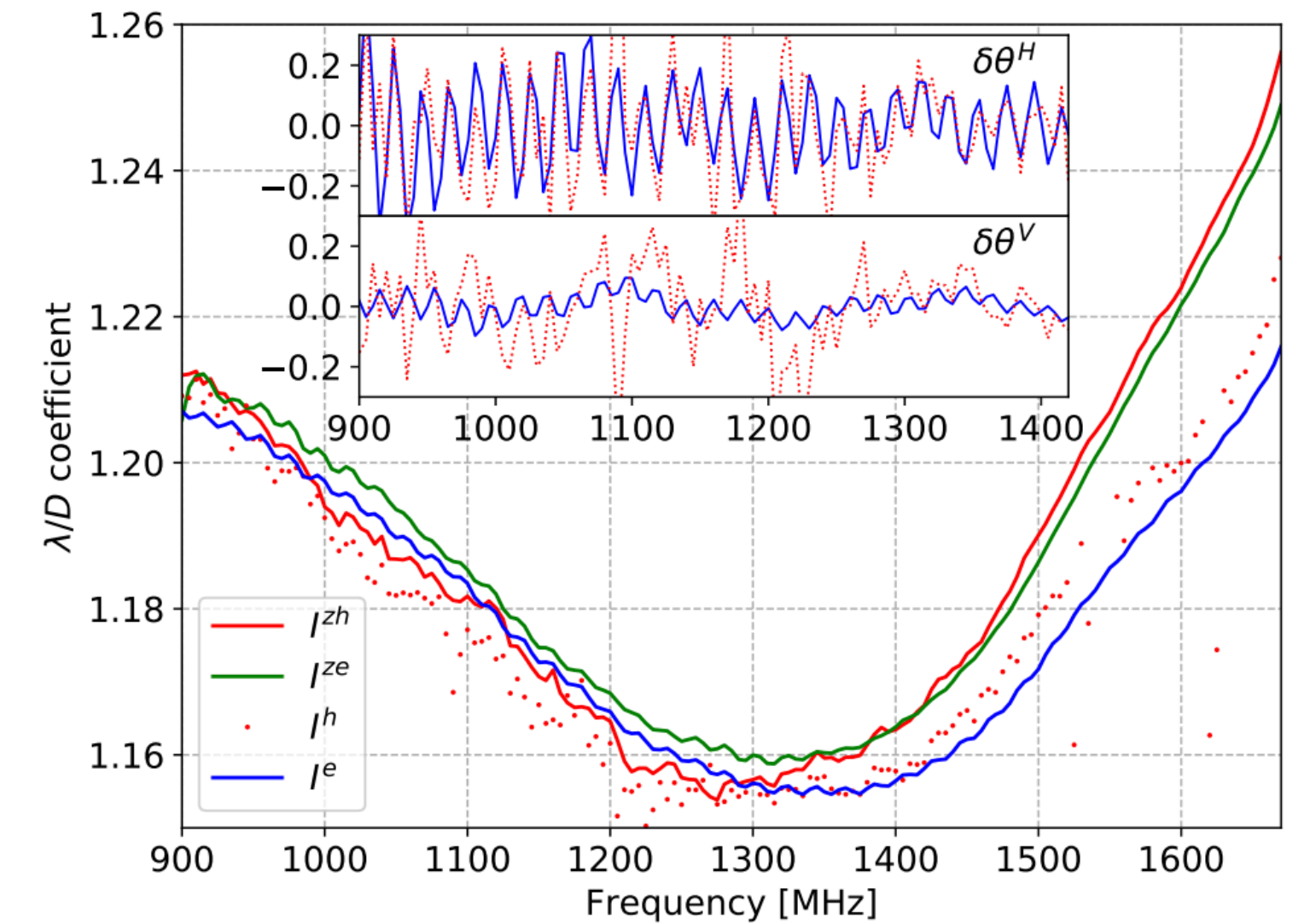
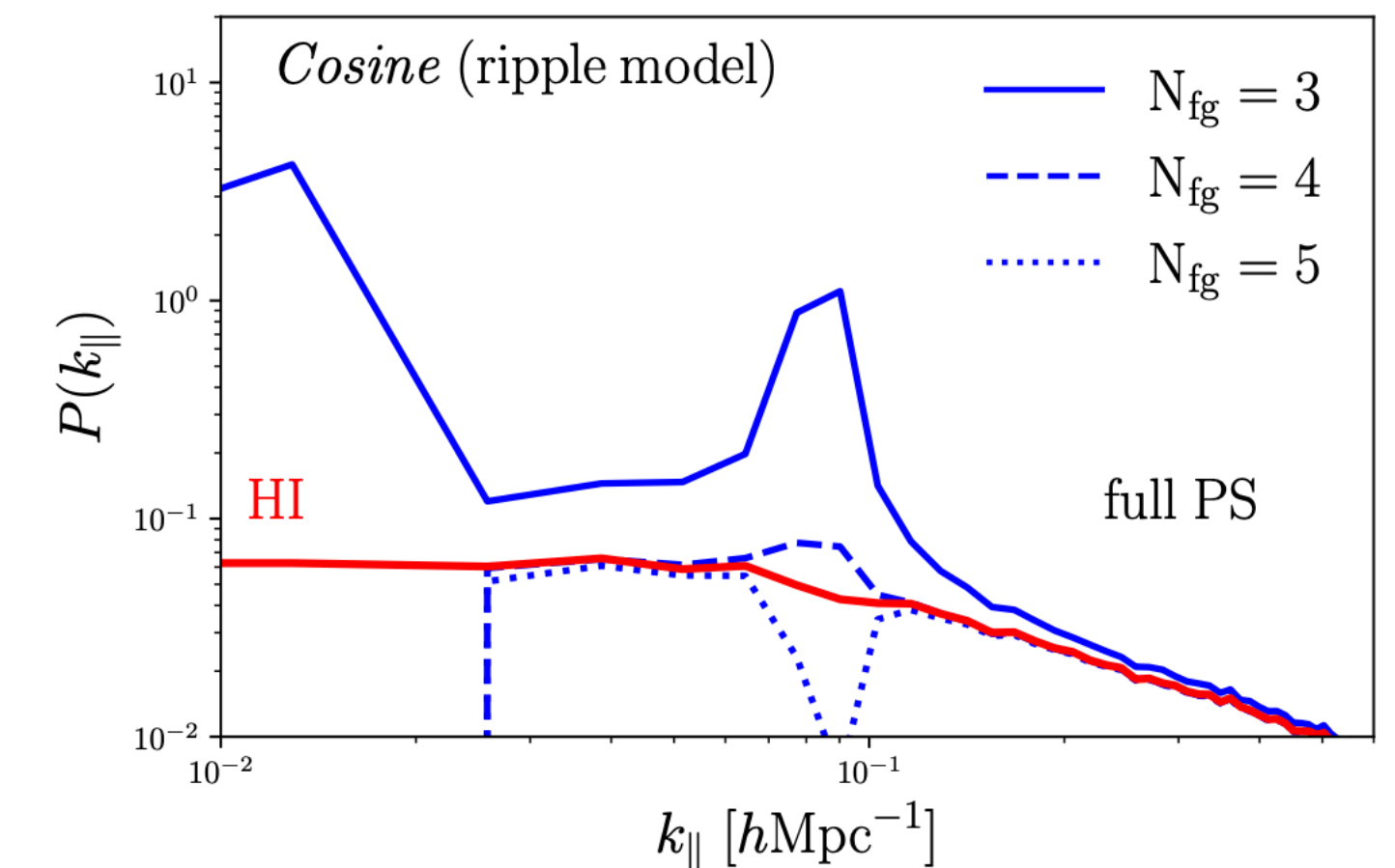
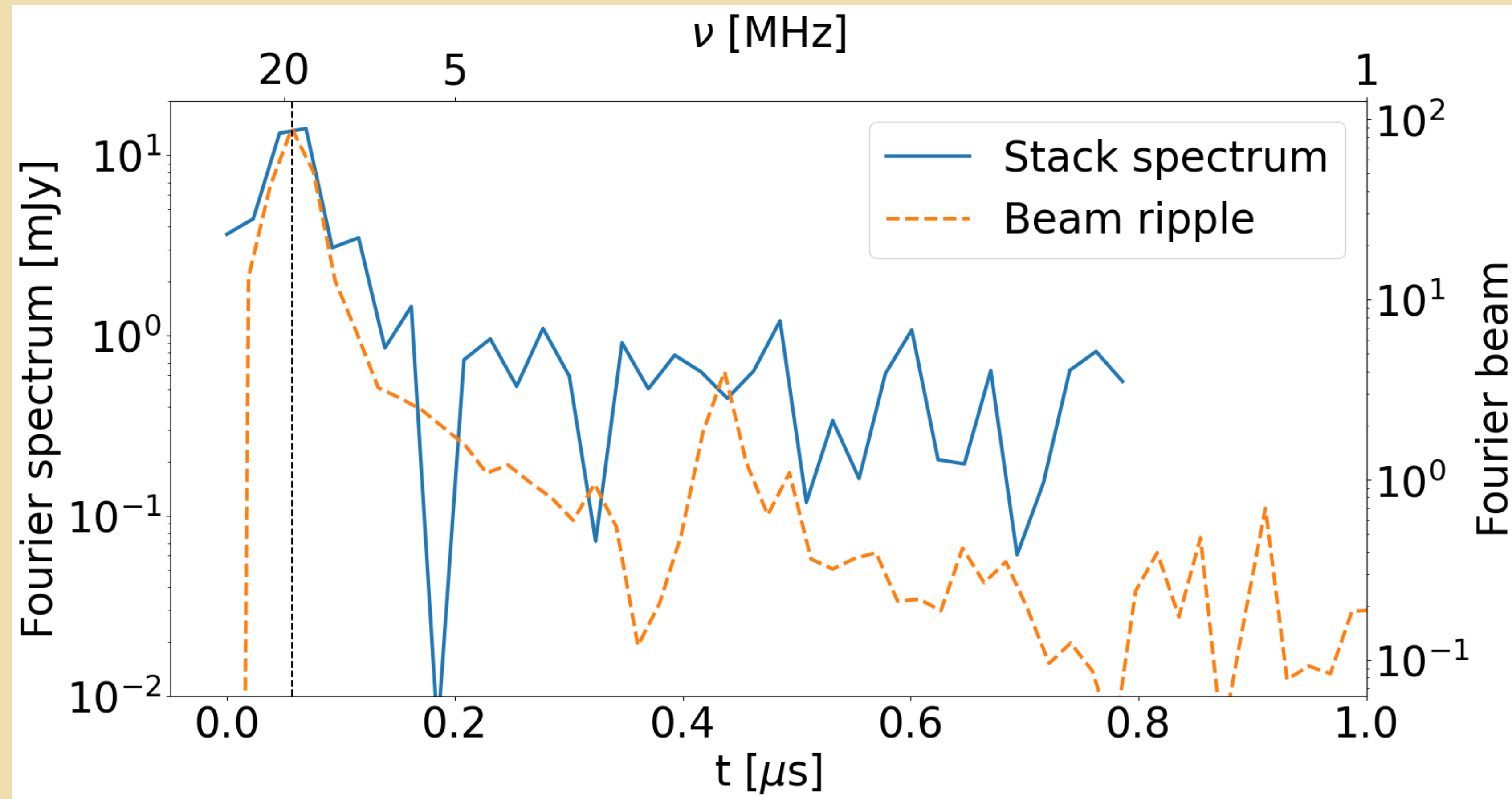


Figure 16. Coefficients of the theoretical beamwidth (λ/D) as a function of frequency for the given AH (red dots) and EM (blue) datasets, and the Zernike-based models created from the AH (red



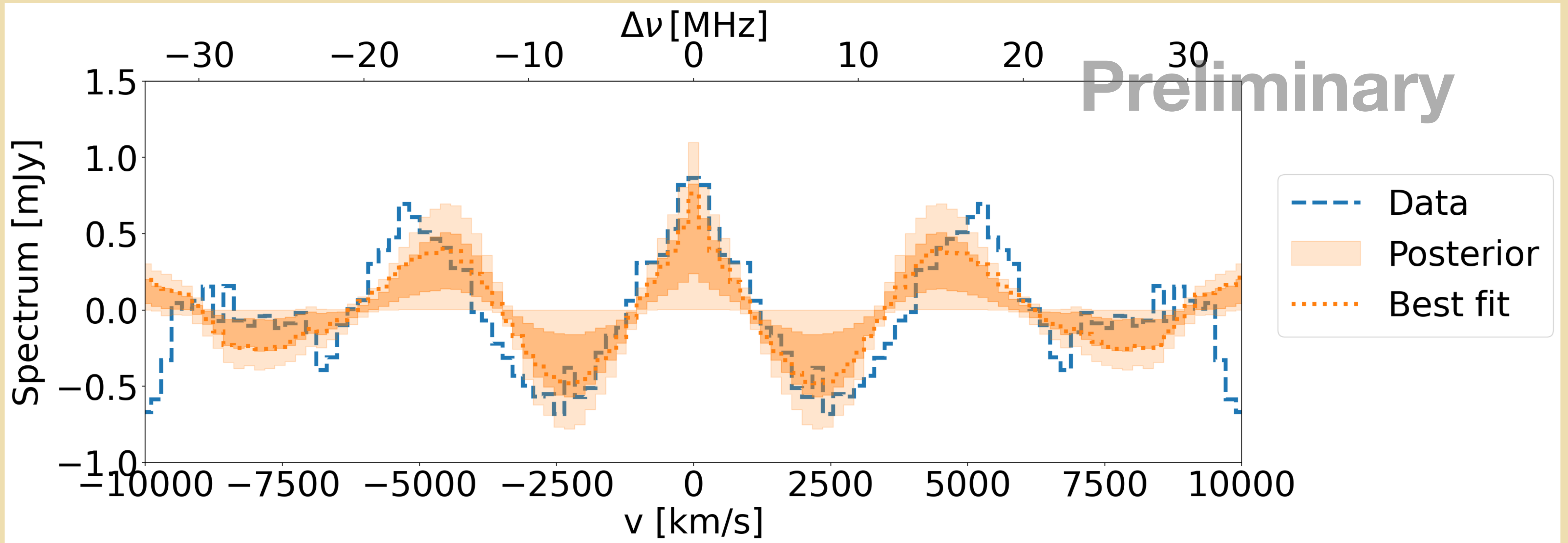
Hunting down the source of systematics

- The Fourier transform of the beam ripple and the Fourier transform of the stacked spectrum match in their peak position
- The systematics in the stacked signal has the **same characteristic frequency scale** as the beam ripple



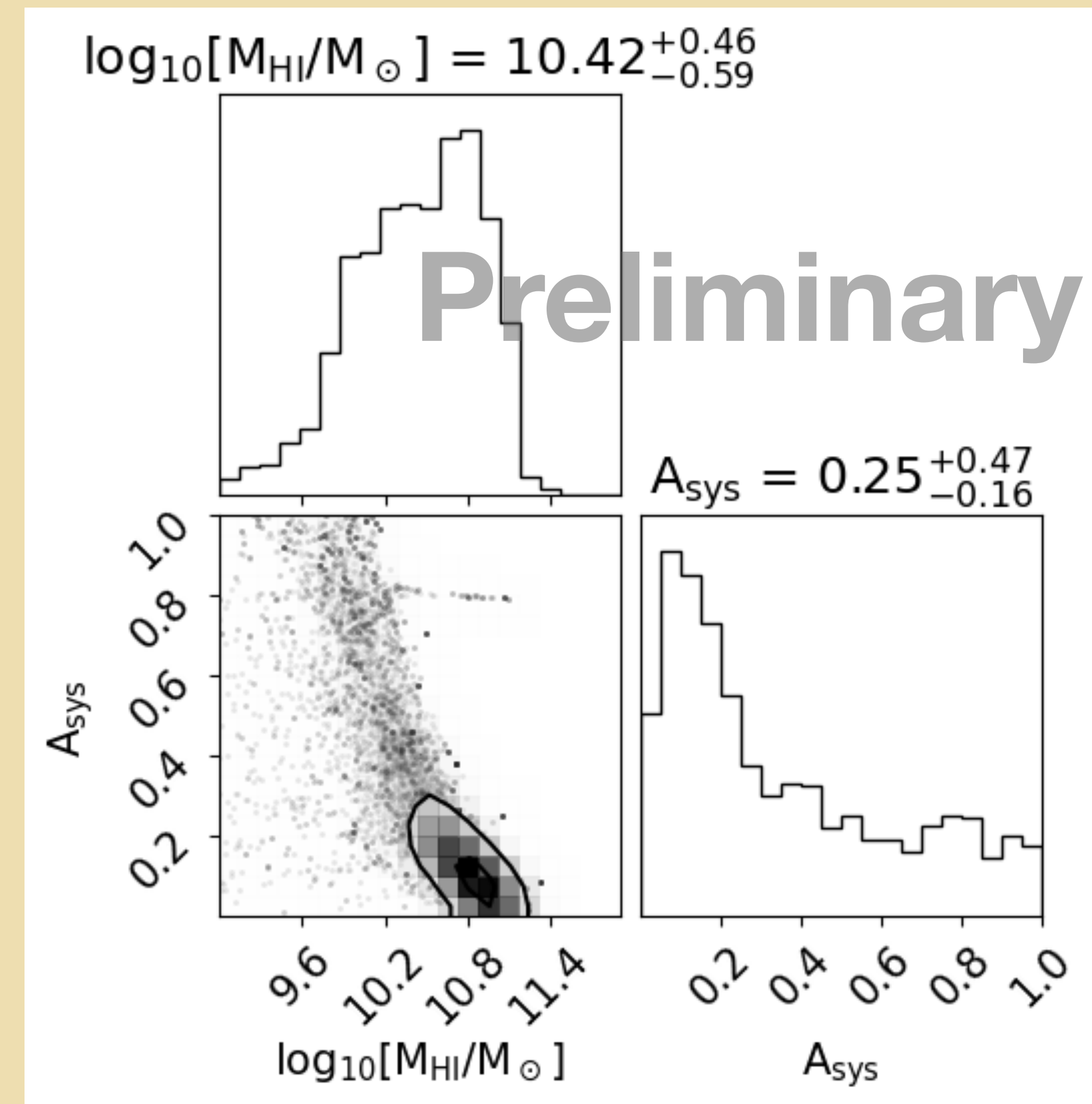
Constraining the systematics

- Simple two-parameter model: amplitude of oscillation and average HI mass of galaxies.
- Fitting suggests a small **mismatch** of frequency.



Constraining the systematics

- The amplitude of the systematics **much larger** than the measured beam ripple ($A > 4\%$ at 95% confidence level).
- Strong degeneracy between the systematics and HI.
- Tentative constraints of HI.
- However, it is likely overestimated due to the incomplete galaxy catalogue and biased due to degeneracy.



Outlook

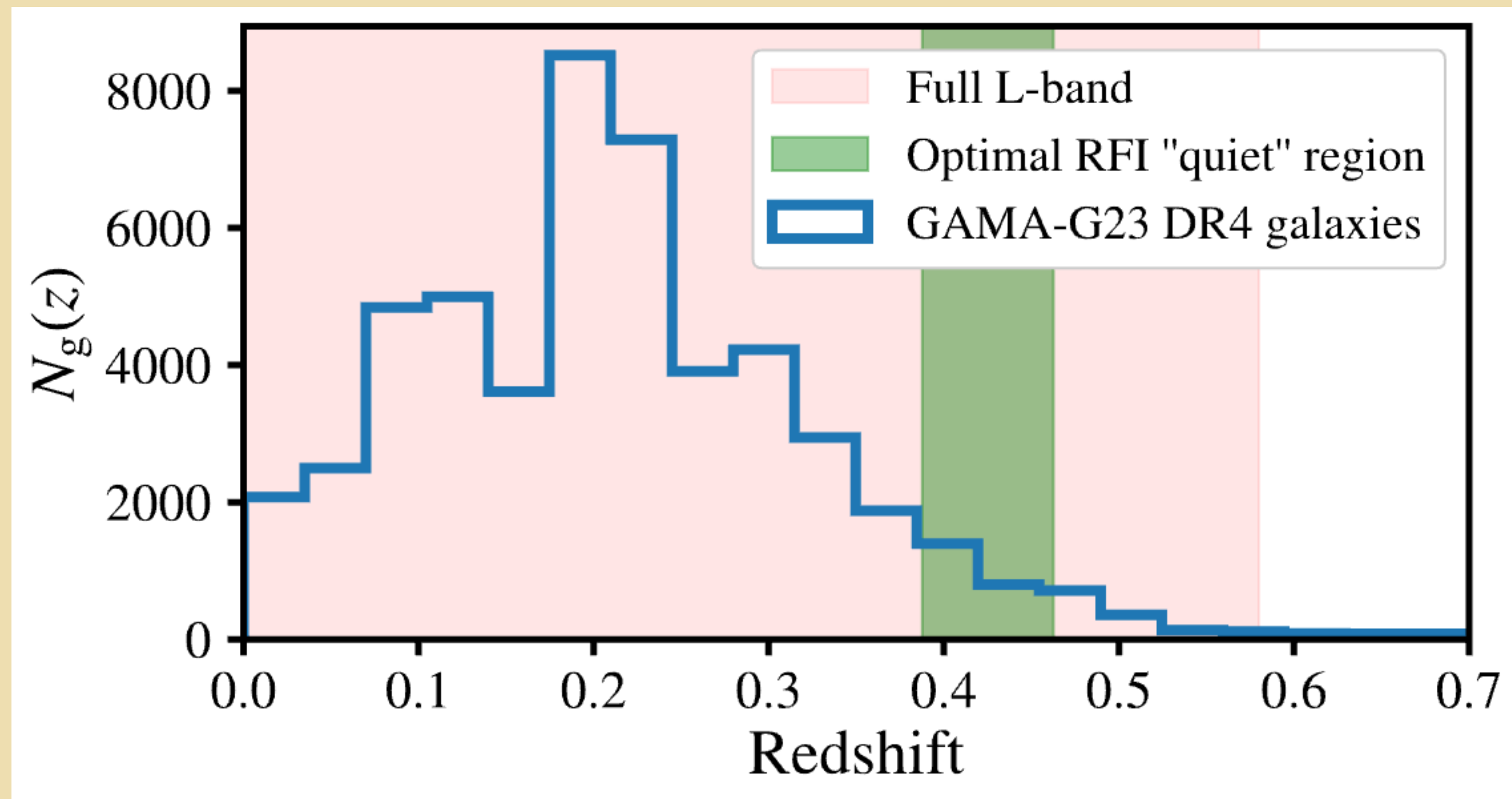
- We can parameterise the beam ripples and incorporate in our forward modelling of the stacked signal
- The stacking measurements can be used to simultaneously marginalise over the HI model and the systematics.
- The fitting results suggest that the systematics is still significant and stands in the way of constraining HI.
- Future MeerKAT UHF and SKAO will fix a few key issues: **data quality, overlap** with galaxy surveys, **signal-to-noise...**

SKAO x Euclid: spec-z

- The cleanest frequency range (UHF) sits around $z \sim 0.5-1.5$. Good overlap with Euclid spec-z
- Power spectrum cross-correlation
- Stacking

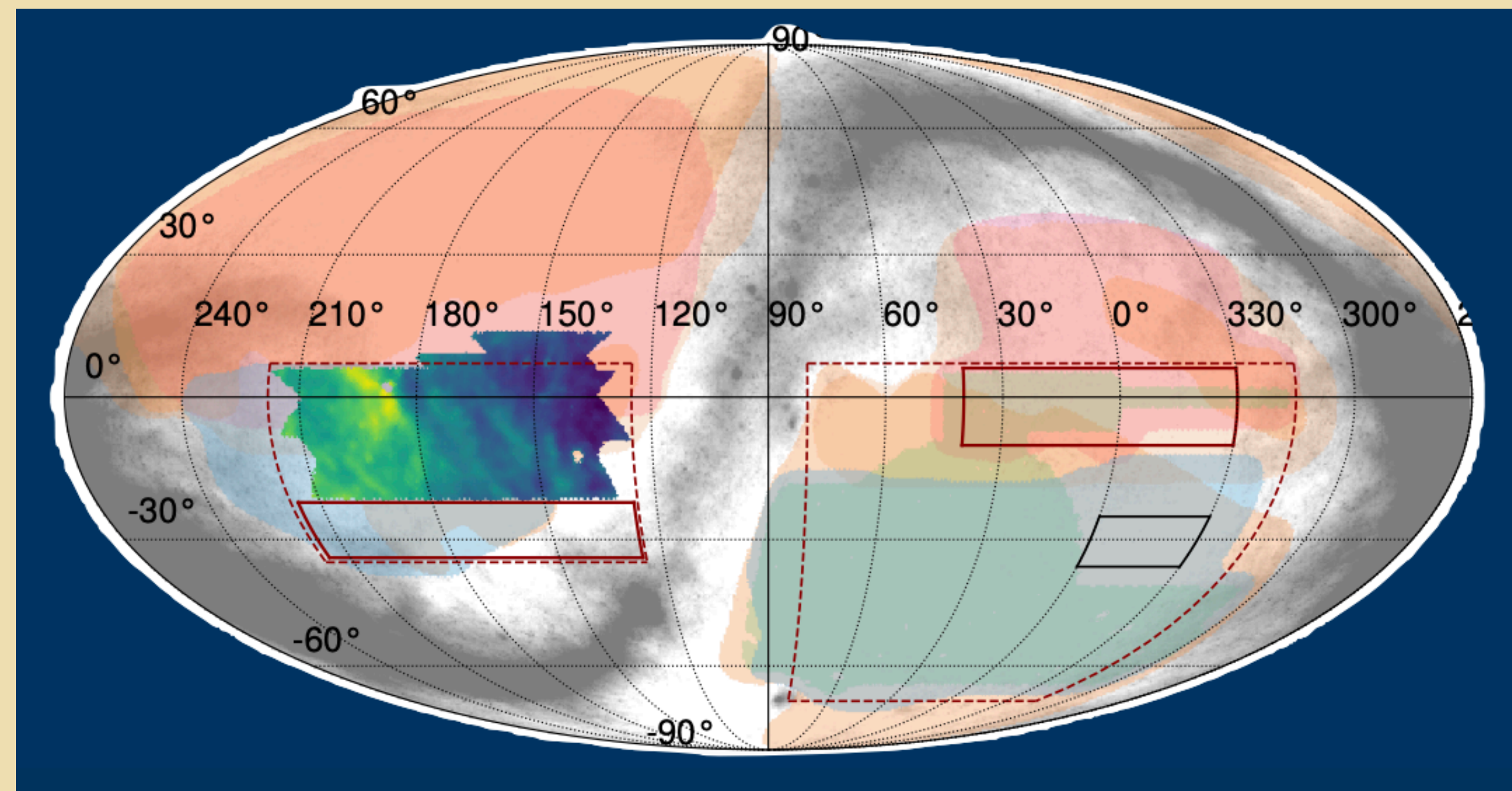
SKAO x Euclid: photo-z

- The current L-band measurement is constrained by the **narrow redshift bin**.
- Selecting galaxies within the z-range using photo-z will completely decorrelate the signals.



SKAO x Euclid: photo-z

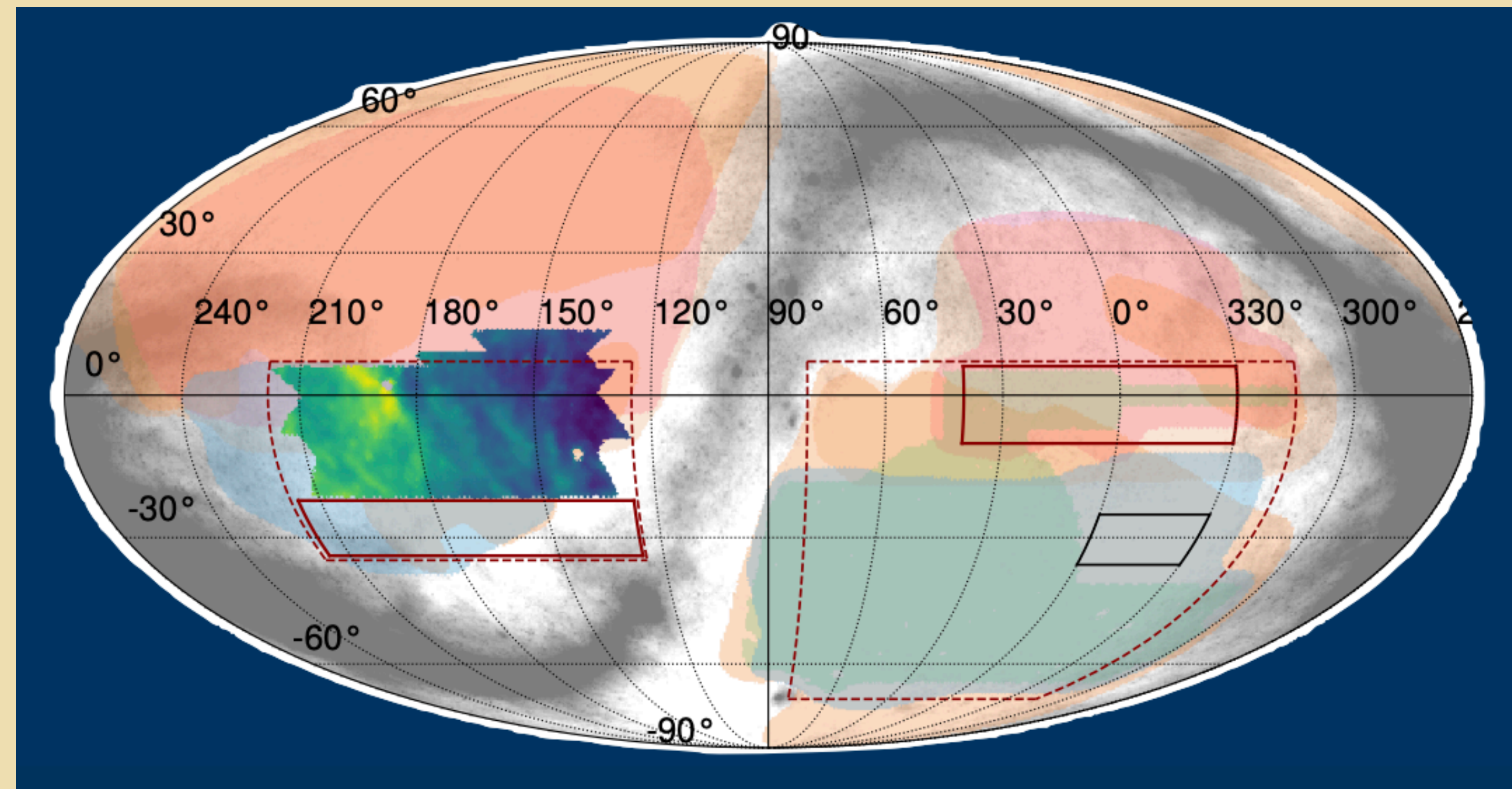
- The MeerKAT UHF survey and future SKA-Mid will cover a wide redshift range.
- 21cm x photo-z will become tangible.
- Need quantification of photo-z errors and 21cm survey specifications
- $P(k)$ first, ultimately $C(l)$ and clustering redshift



Work led by Jiakang “Jack” Han,
with ZC, Stefano Camera and
Alkistis Pourtsidou

SKAO x Euclid: photo-z

- Lots of open questions:
- Modelling of redshift error kernel beyond Gaussian
- Effects of catastrophic outliers
- Optimal estimator using posteriors instead of mean



Work led by Jiakang “Jack” Han,
with ZC, Stefano Camera and
Alkistis Pourtsidou

SKAO x Euclid: photo-z

- Bayesian stacking:
- Weights of the stacked cubelets are Bayesianised.
- Can be applied to photo-z galaxies for stacking

Measuring the H I mass function below the detection threshold

Hengxing Pan^{1,2,3}★, Matt J. Jarvis^{3,4}, James R. Allison³, Ian Heywood^{3,5,6},
Mario G. Santos^{4,6}, Natasha Maddox⁷, Bradley S. Frank^{6,8,9}, Xi Kang¹

Pan et al.,
[1907.10404](#)

Probing the cosmic web in Ly α emission over large scales: an Intensity Mapping forecast for DECaLS/BASS and DESI

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¹Department of Astronomy, Tsinghua University, Beijing 100084, China

²National Astronomical Observatories, Chinese Academy of Sciences, Beijing 100012, China

³Department of Mathematics and Theory, Peng Cheng Laboratory, Shenzhen, Guangdong 518066, China

Renard et al.,
[2406.18775](#)

Conclusion

- Spectral line stacking using single dish IM survey of MeerKAT/SKA-Mid faces a series of challenges before HI science can be extracted
- The scale of measurements, as well as **mixing of systematic and signal**, requires forward modelling of the observed spectrum
- Stacking is a very powerful tool for validating detection, analysing systematics, and can be used to simultaneously **constrain HI signal** and observational **systematics**
- In the future, MeerKAT and SKA-Mid can be used to measure quantities such as HI density and scaling relations through stacking.

Ad: the meer21cm package

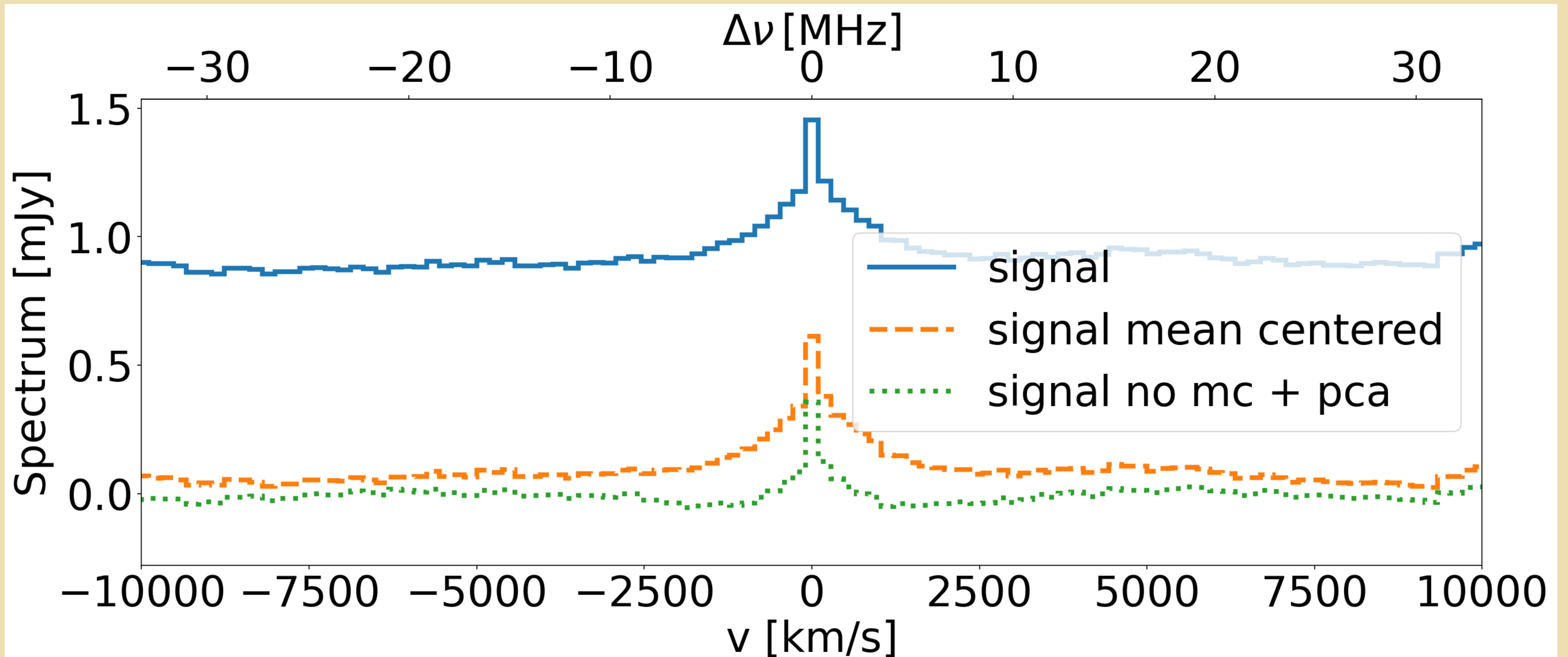
- Used in this work for performing stacking analysis and forward modelling.
- Also working on integrating power spectrum pipeline
Cunnington & Wolz, [2312.07289](#)
- Fully modulated, easy to use, thoroughly tested and will be documented
- Will be public soon(ish)

The image shows two side-by-side screenshots. The left screenshot is a dark-themed documentation page for 'meer21cm'. It features a search bar at the top, a 'CONTENTS' section with links to 'Installation', 'Developing meer21cm', 'Examples', 'Authors', 'Releases', and 'meer21cm package'. The right screenshot is a light-themed GitHub repository page for 'meer21cm'. It includes a 'View page source' link, a 'codecov 99%' badge, a description stating 'meer21cm deals with single dish 21cm intensity mapping using MeerKAT.', an 'Installation' section with a 'Clone this repo:' button and a code block containing 'git clone git@github.com:zhaotingchen/meer21cm.git', and an 'And run' section with a code block containing 'cd meer21cm/' and 'pip install -e .'. Below this, it says 'For more detailed instruction check [installation guide](#).' and a 'Development' section with the text 'If you want to contribute to the developing of `meer21cm`, make sure you check [the workflow](#).'

Thanks!

Backup: Why PCA removes plateau

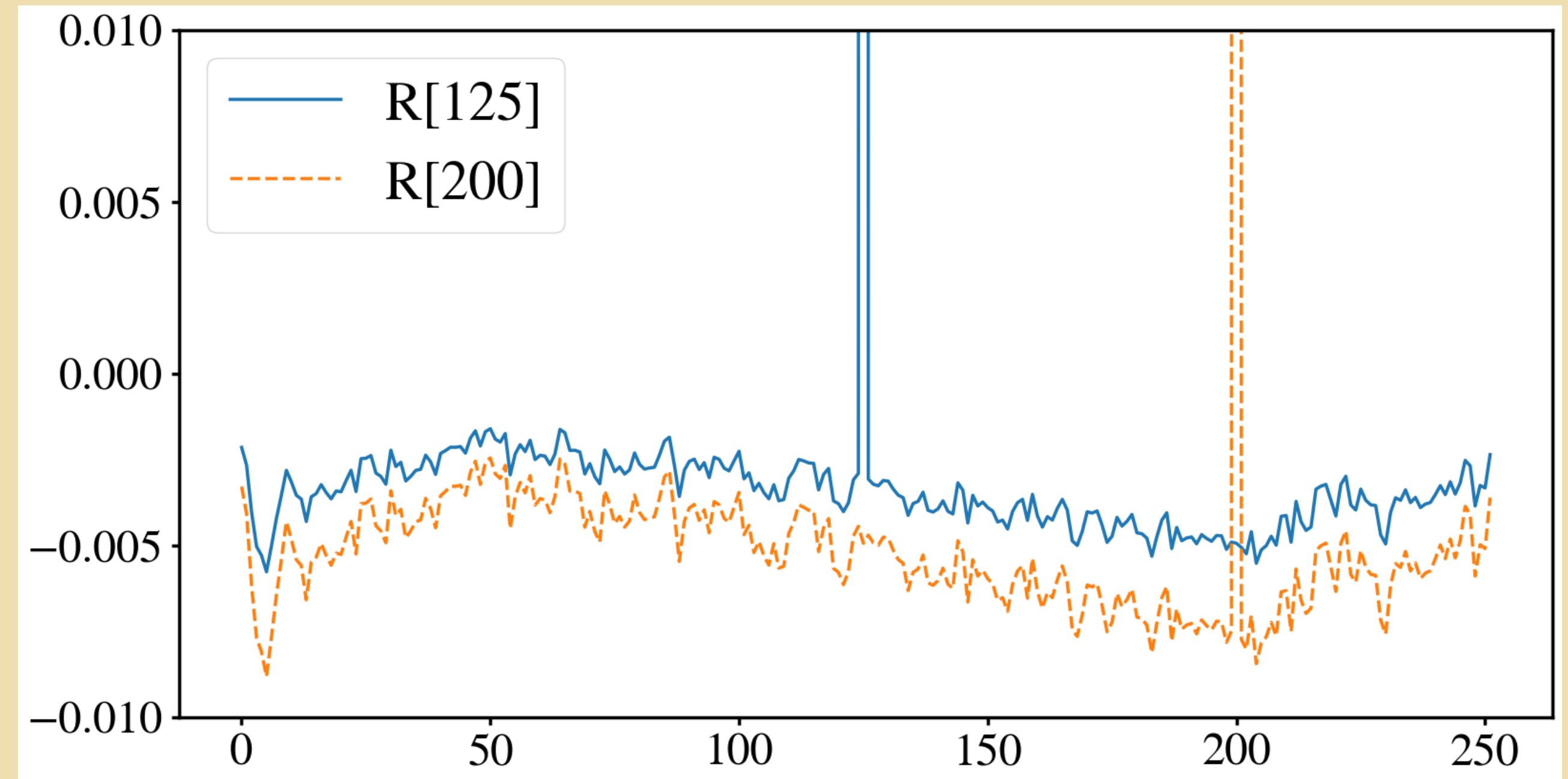
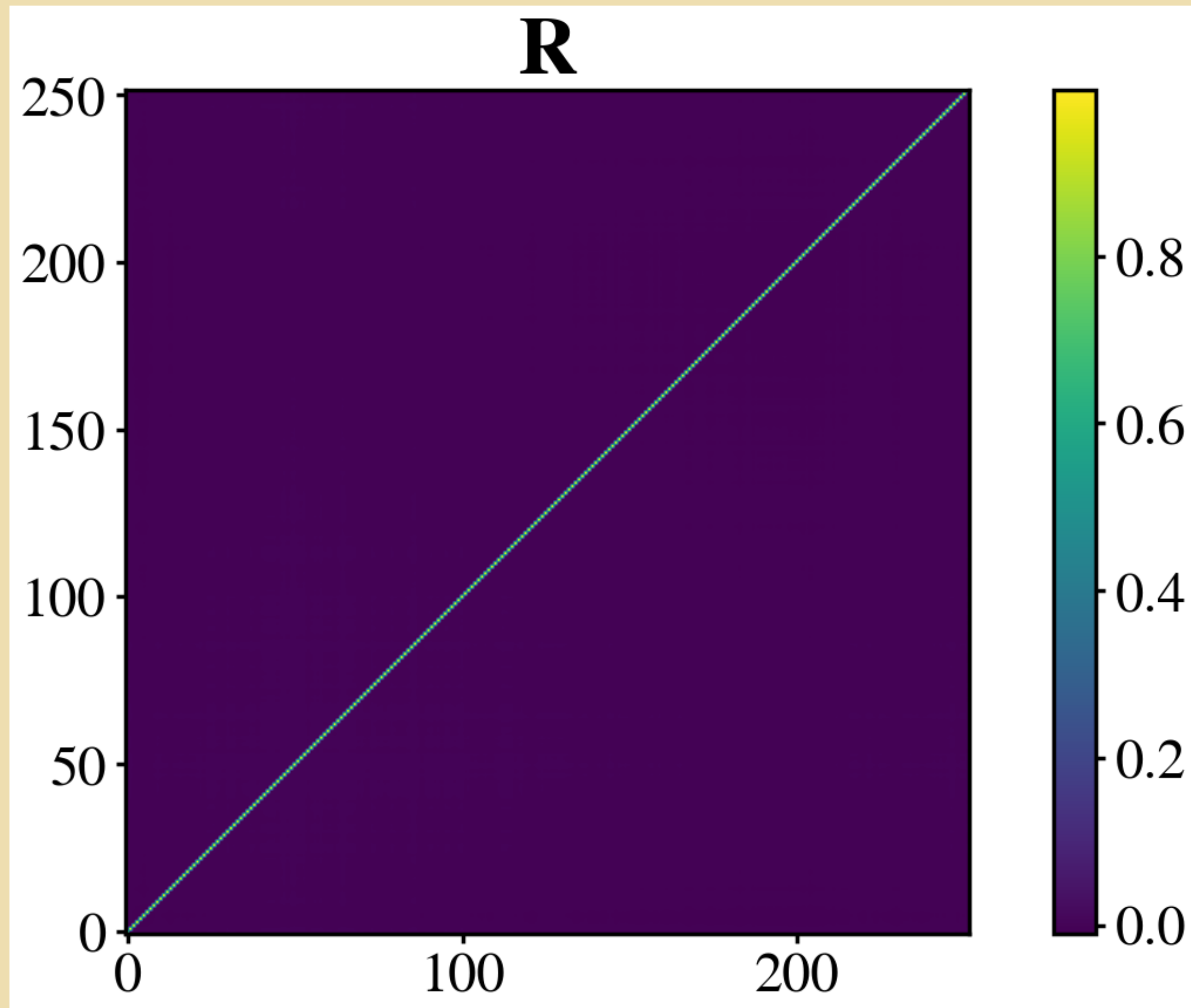
- It is naturally to then conclude that PCA removes the mean so the plateau is gone. But actually even without mean centering:



Backup: Why PCA removes plateau

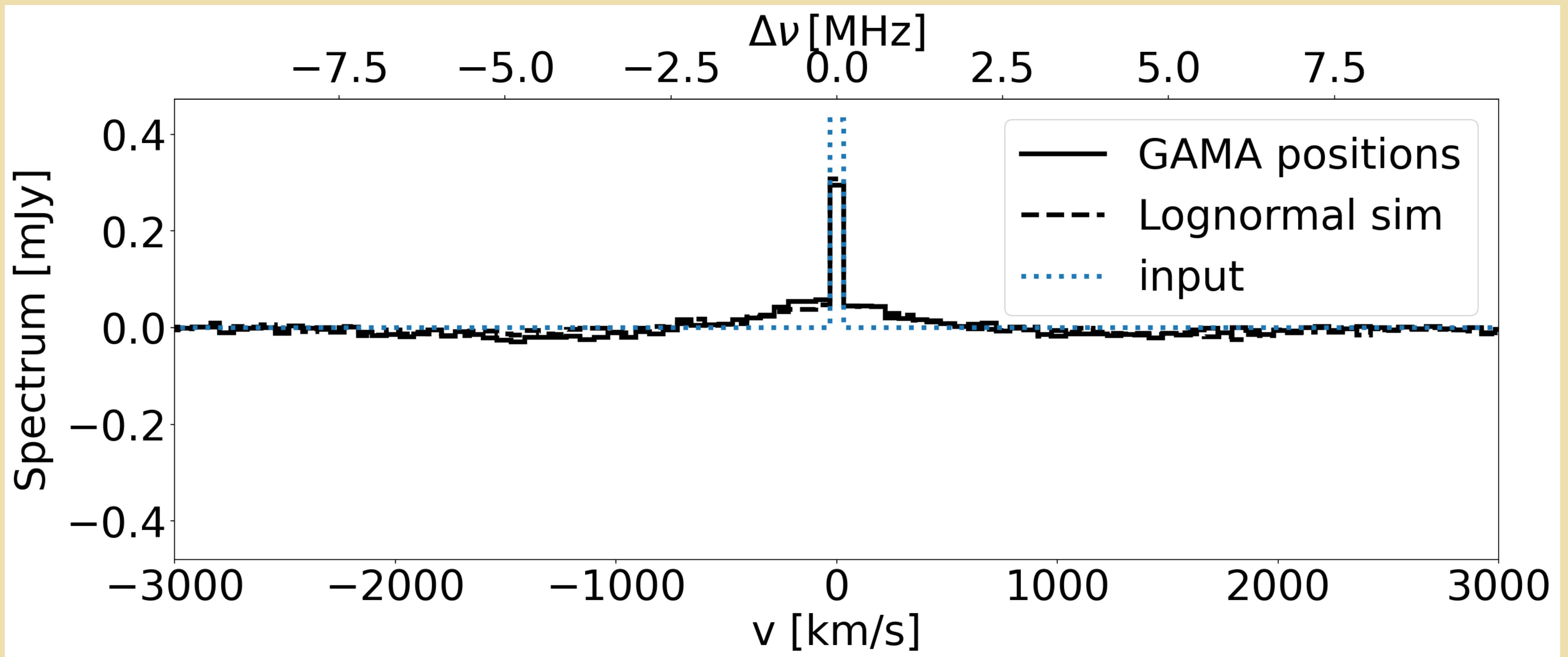
- What PCA does is that it preserves the peak, but also scatters the peak amplitude into negative values across the frequencies:

$$\vec{r} = \mathbf{R}\vec{m} = (\mathbf{I} - \mathbf{A}\mathbf{A}^T)\vec{m}$$



Backup: matching the clustering amplitude

- Simulations using lognormal galaxy mock positions and actual GAMA galaxy positions match quite well.

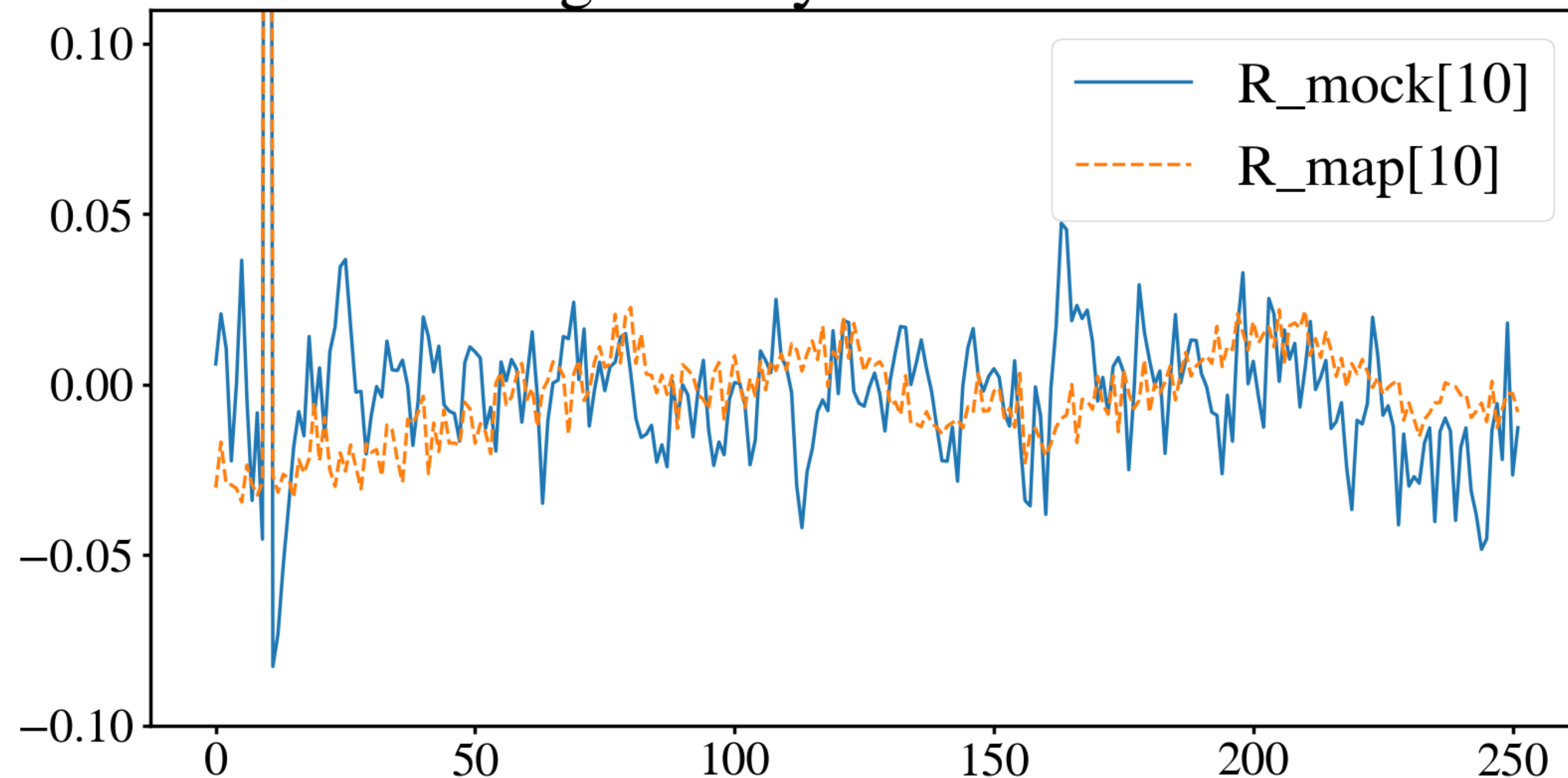


Backup: correlation comes from PCA

- The thermal noise in the map is not correlated originally.
- The correlation also comes from the fact that PCA matrix is applied to the data
- The oscillation structure is visible in the PCA matrix.

$$\vec{r} = \mathbf{R}\vec{m} = (\mathbf{I} - \mathbf{A}\mathbf{A}^T)\vec{m}$$

10-mode PCA on signal-only mock and on MeerKLASS map



Backup: parameter fitting

- Need careful treatment of priors for modelling the systematics

