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# Advanced imaging

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European Radio Interferometry School 2022

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# Outline

1. Recap of imaging
2. Other deconvolution algorithms (e.g., multi-frequency, multi-scale)
3. Wide-field imaging and direction dependent effects

# Recap of imaging

- After 'perfect calibration' the visibilities are represented by the following equation,

$$V(u, v, w) = \iint_{lm} \frac{B(l, m)}{n} \exp \left\{ -2\pi i [ul + vm + w(n - 1)] \right\} dl dm$$

$$\text{where } n = \sqrt{1 - l^2 - m^2}$$

- Here,
  - $(u, v, w)$  = interferometer geometric vector
  - $(l, m)$  = directional cosines / sky coordinates
  - $B(l, m)$  = sky brightness / intensity distribution

With imaging, **we want to calculate  $B(l, m)$  from  $V(u, v)$**

# Recap of imaging

$$V(u, v, w) = \iint_{lm} \frac{B(l, m)}{n} \exp \left\{ -2\pi i [ul + vm + w(n - 1)] \right\} dl dm$$

$$\text{where } n = \sqrt{1 - l^2 - m^2}$$

- In the imaging lecture / workshop, we made the assumption that we are observing a small field-of-view ( $l, m \rightarrow 0$ ) or we have short baselines ( $w \rightarrow 0$ ). This means that we can omit the  $w$  term and the equation becomes,

$$V(u, v) \approx \iint_{l,m} B(l, m) \exp \left\{ -2\pi i [ul + vm] \right\} dl dm$$

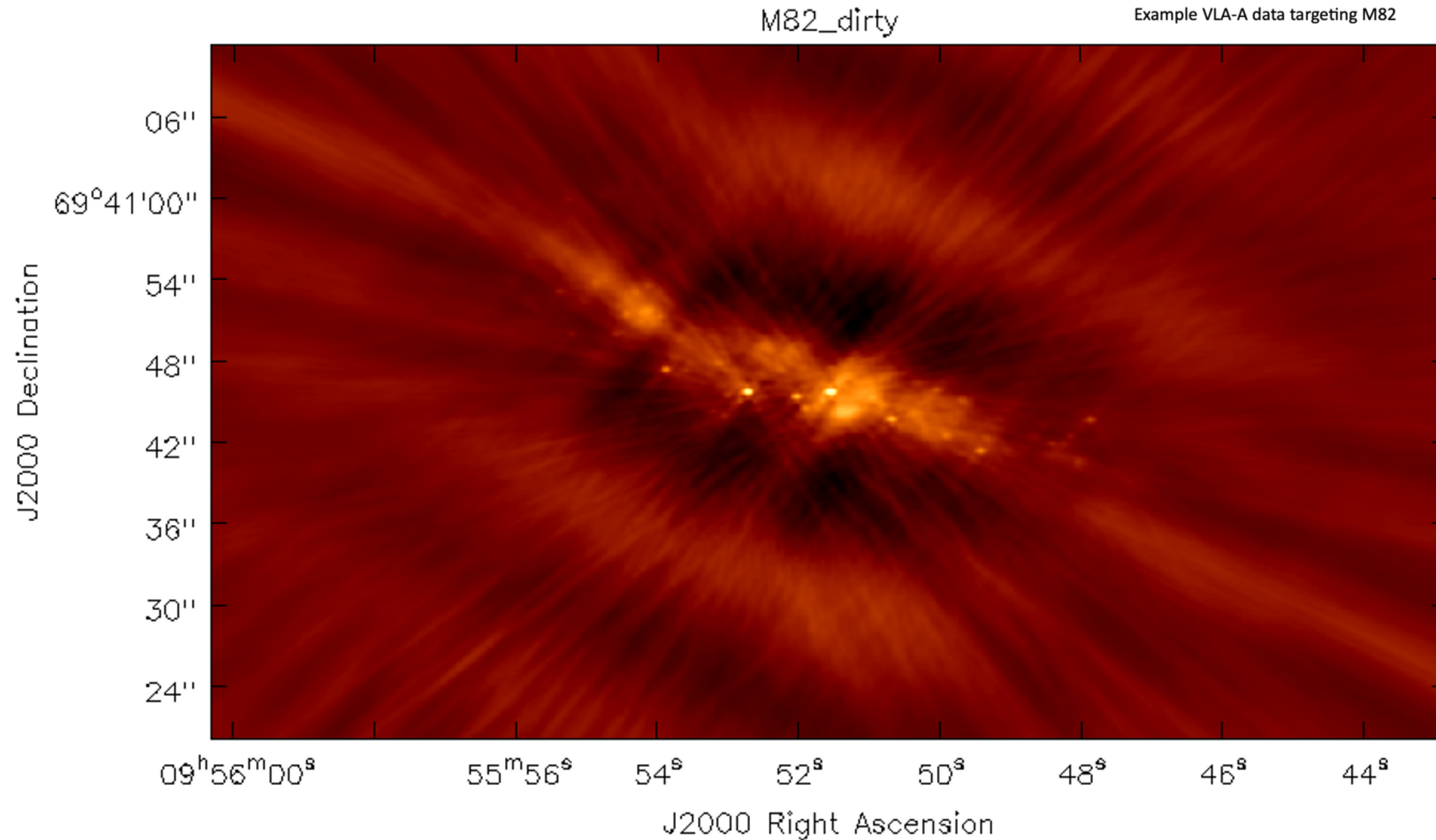
- **Relationship between  $V(u, v)$  and  $B(l, m)$  is?**





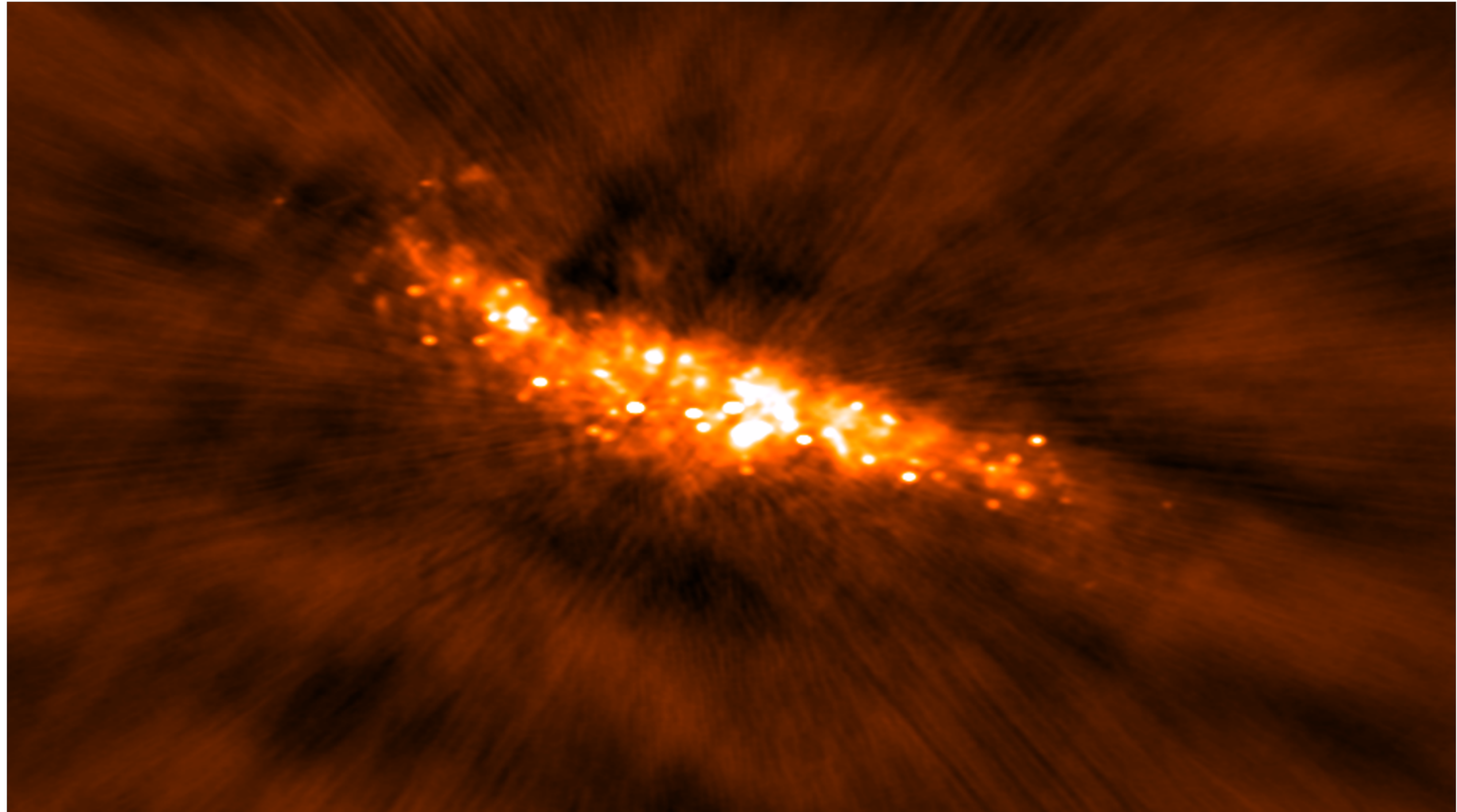


# Dirty image

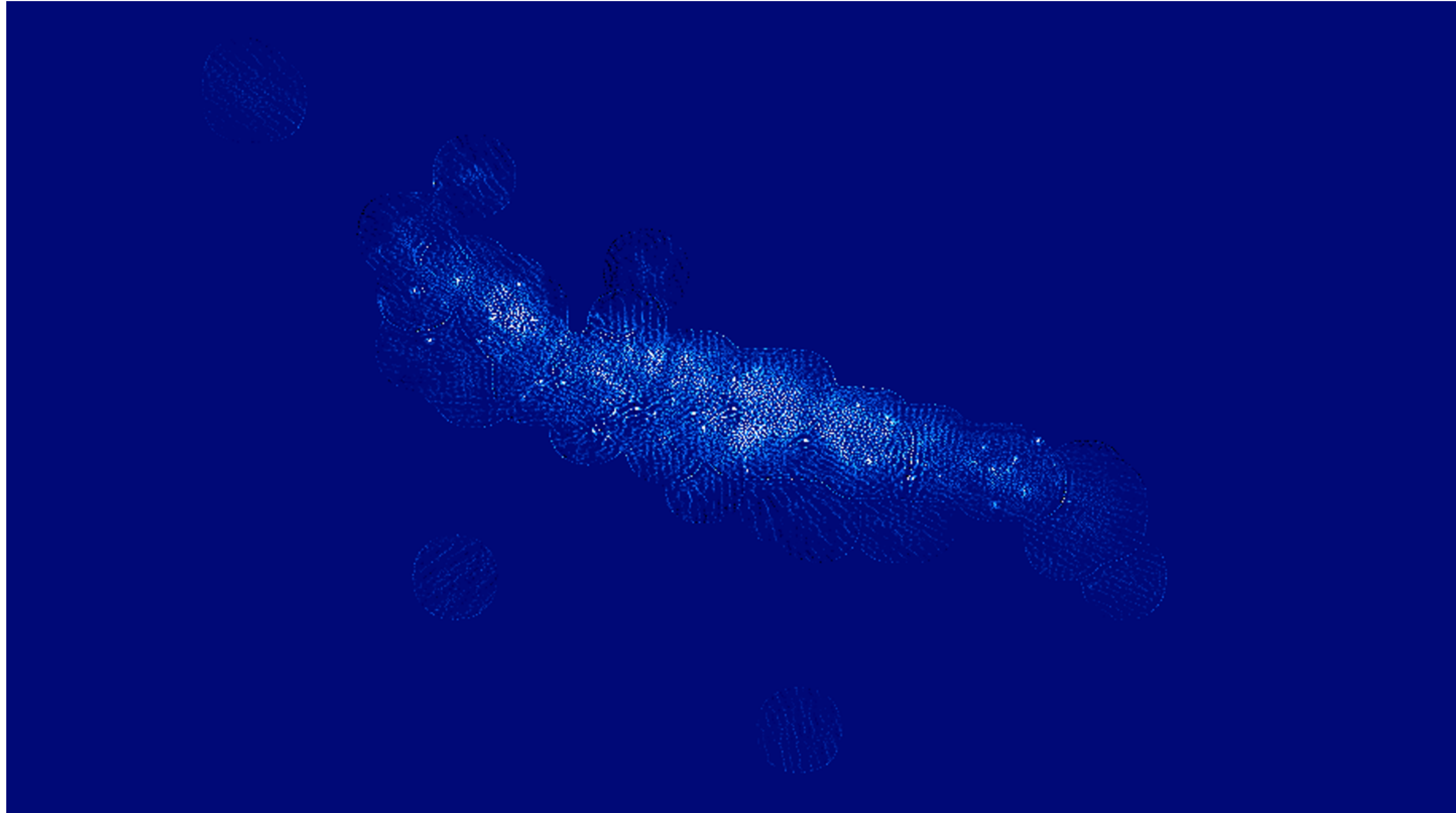




# Högbom deconvolution



# Högbom deconvolution

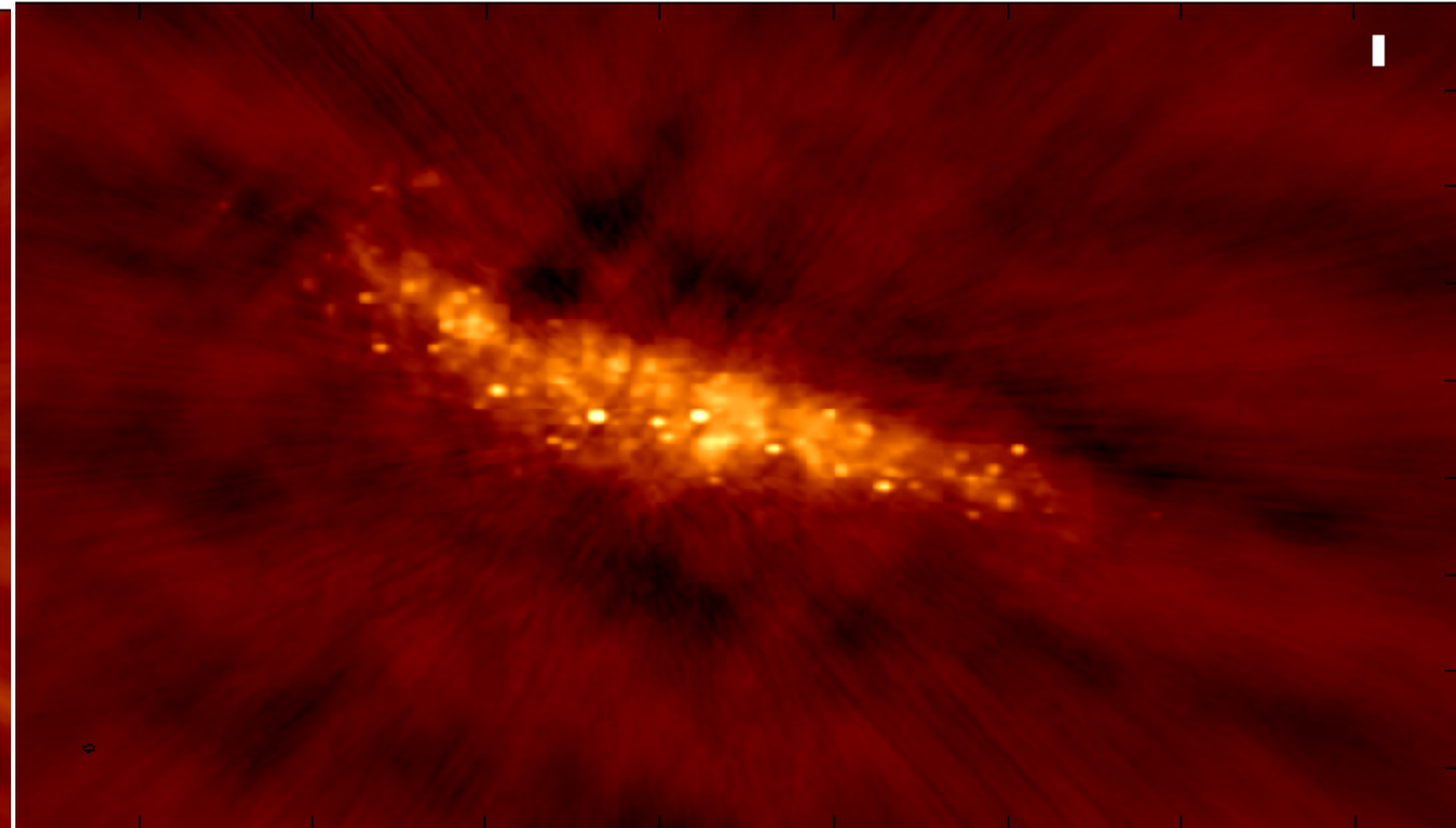
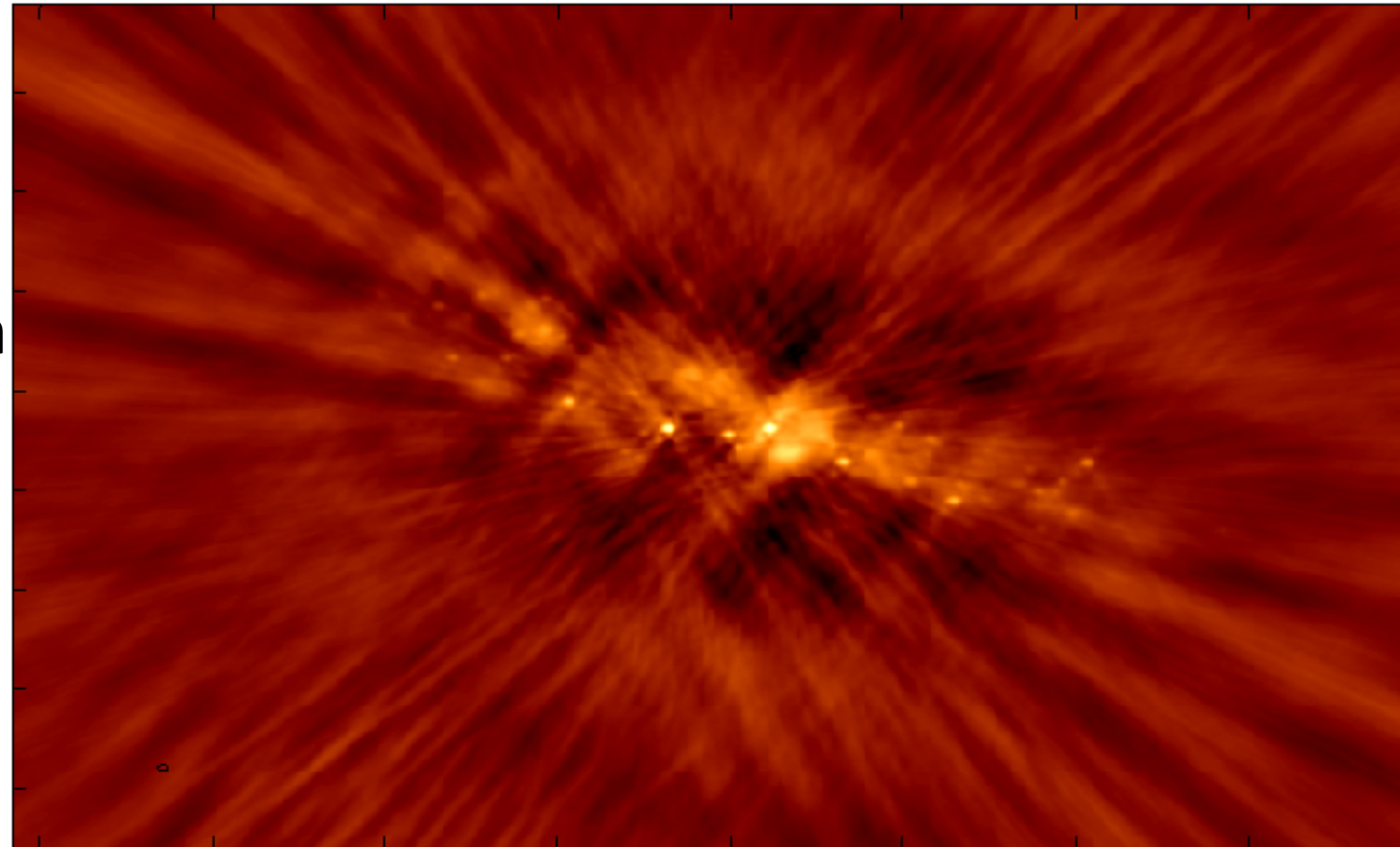




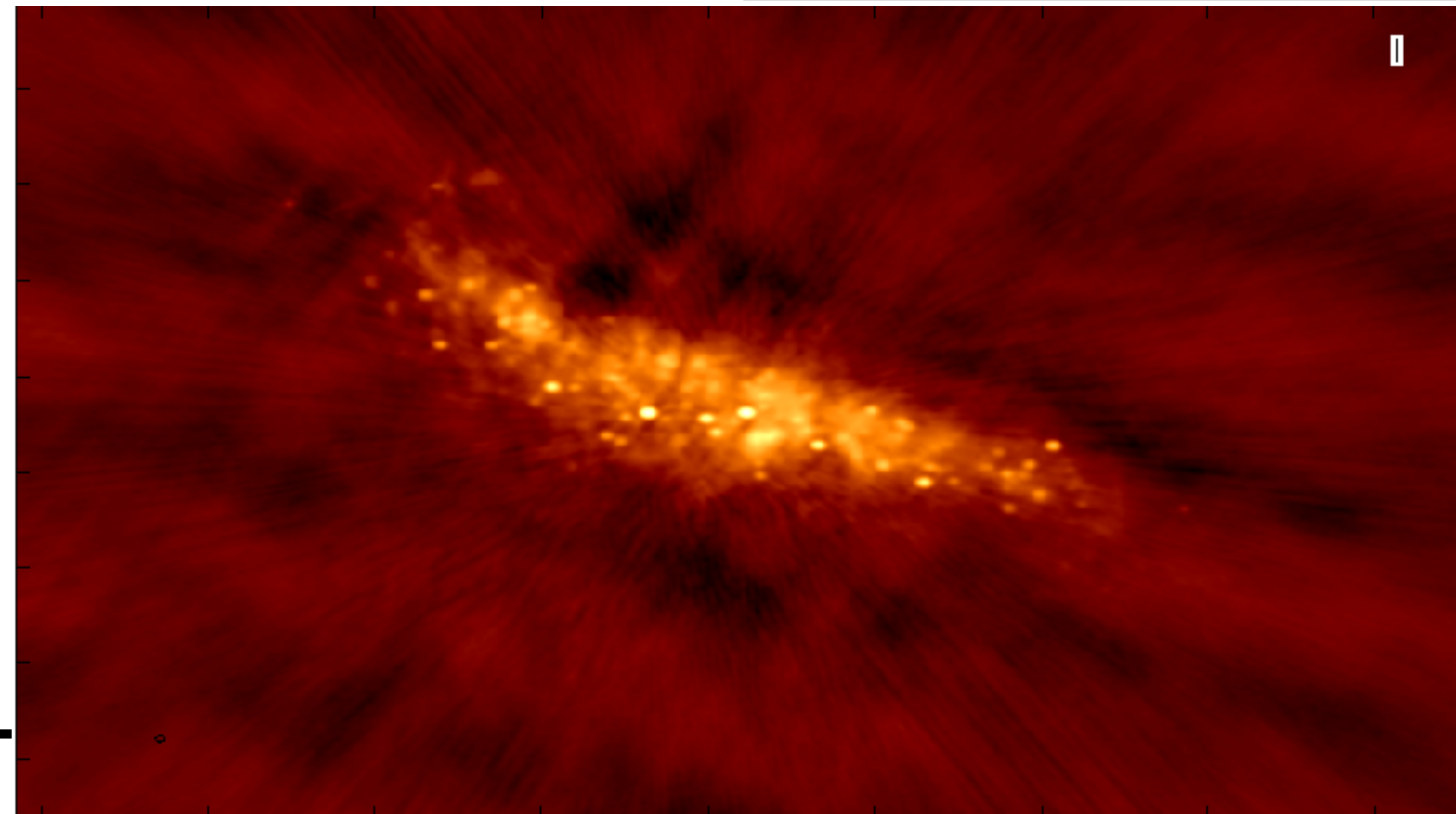
# Many forms of CLEAN

Clark

Maximum  
Entropy  
Method



Clark-Stokes



# Deconvolving diffuse structure - multiscale

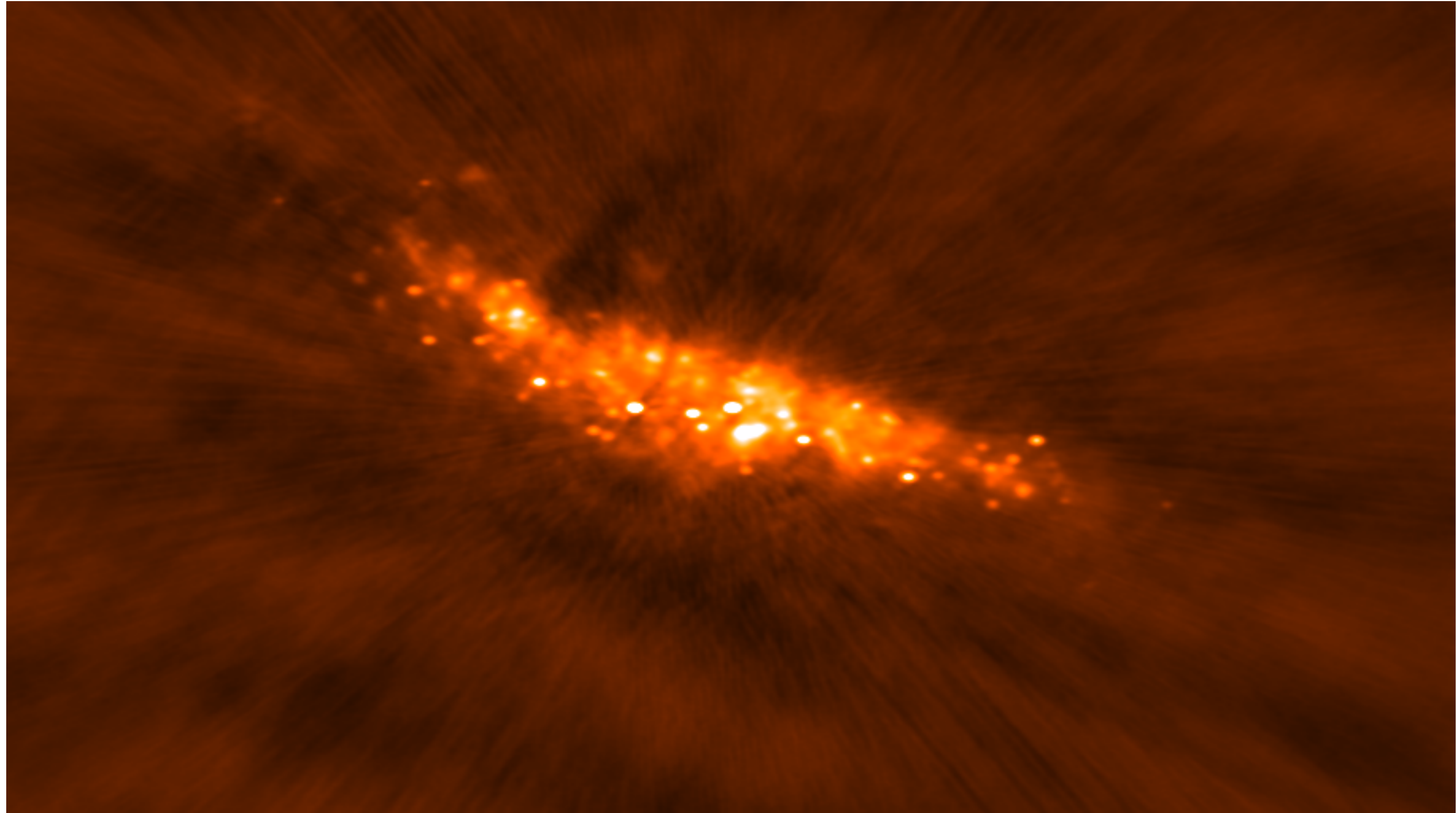
- Improved algorithm by Cornwell (2008) : “multi-scale clean”
- Fits **small smooth Gaussian kernels** (and delta functions) during a Högbom CLEAN iteration
- Implemented in CASA tclean. Advised to use pixel scales corresponding to orders of the dirty beam size and avoid making scale too large compared to the image width/lowest spatial frequency.

```
deconvolver = 'multiscale' # Minor cycle algorithm (hogbom,clark,m
                          #   ultiscale,mtmfs,mem,clarkstokes)
scales      = [0, 1, 5, 15] # List of scale sizes (in pixels) for
                          #   multi-scale algorithms
smallscalebias = 0.6        # A bias towards smaller scale sizes
restoringbeam = []         # Restoring beam shape to use. Default
                          #   is the PSF main lobe
```

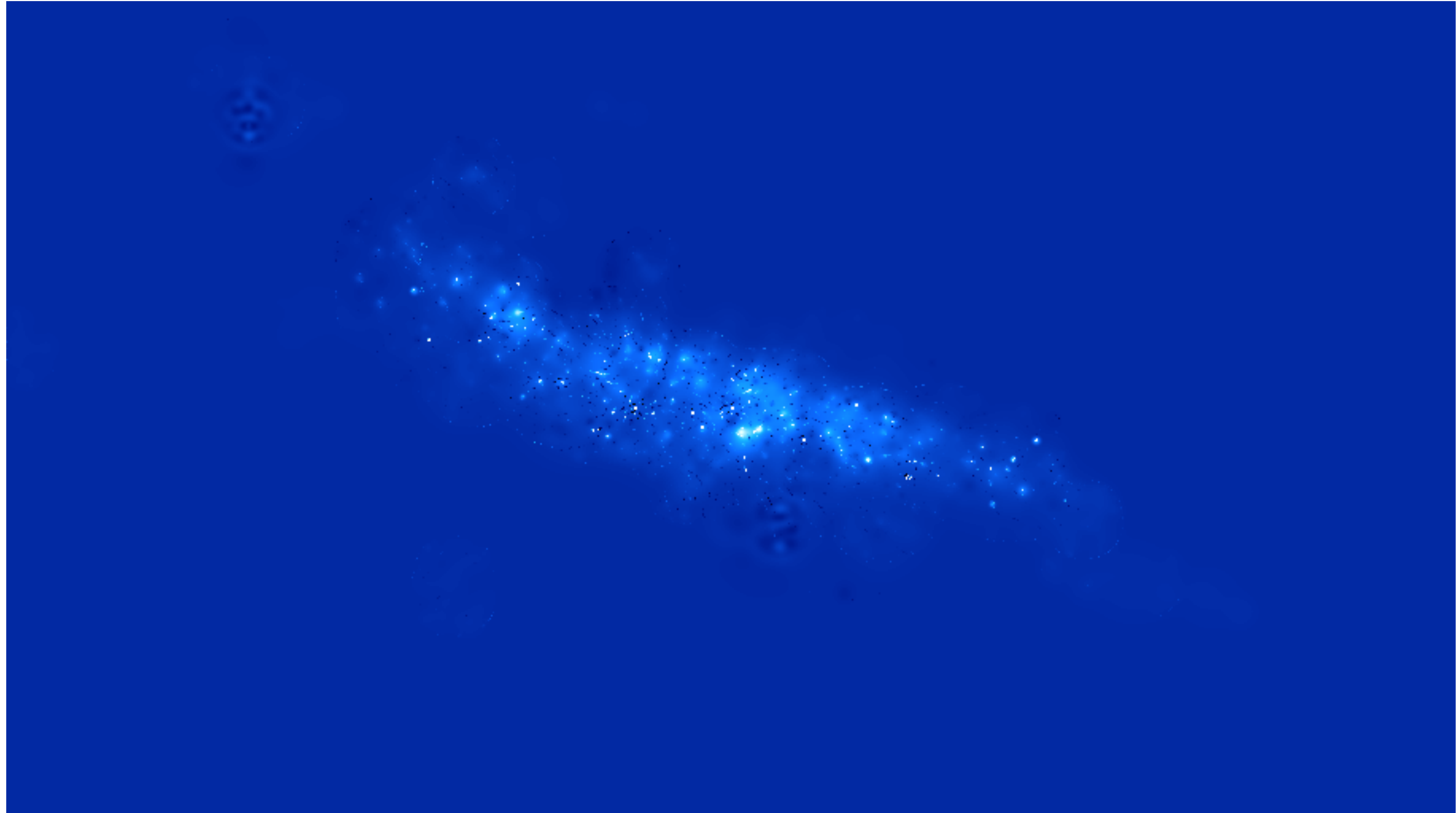
CASA tclean



# Multi-scale image



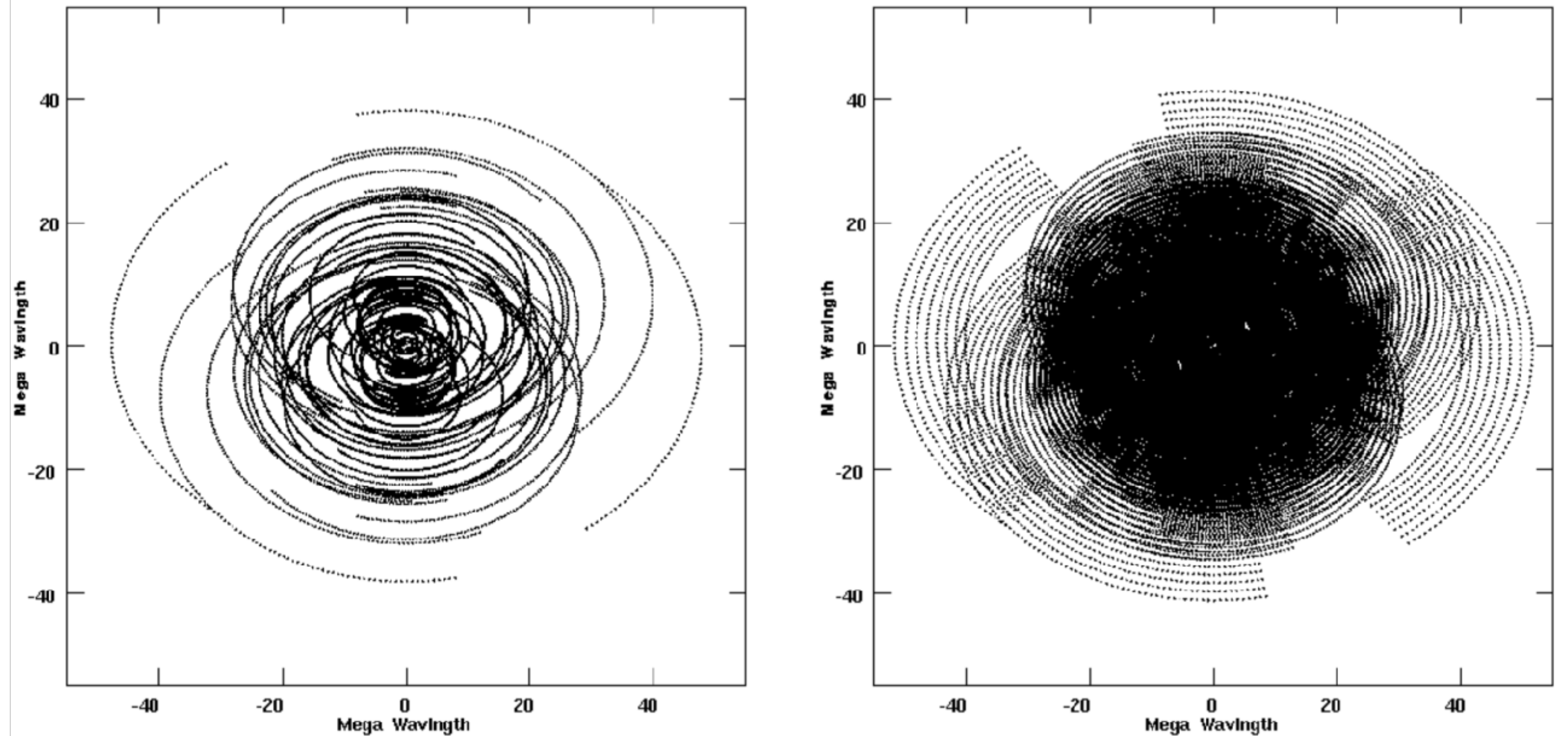
# Multi-scale model





# Dealing with wide-bandwidths - mtmfs

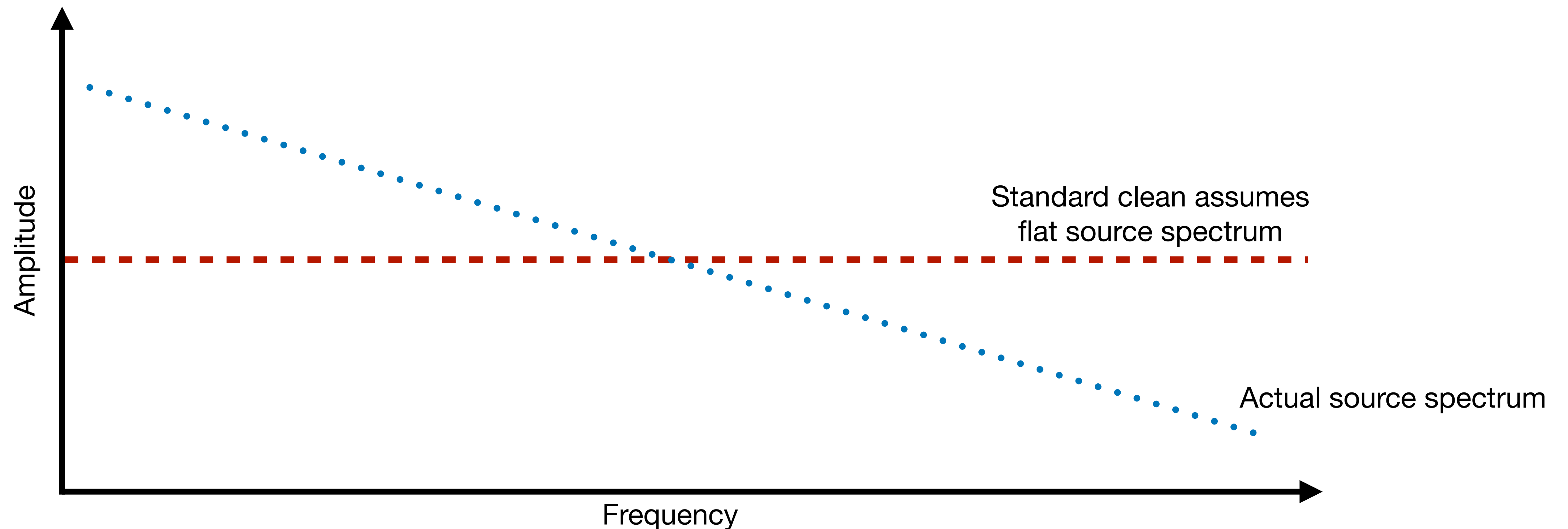
- Multi-frequency synthesis (MFS) means gridding different frequencies on the same uv grid.
- Done automatically to improve  $uv$  coverage.



**Figure 16.1:** *Left (a):* VLBA  $(u, v)$  coverage for a full track at  $\delta = 50^\circ$ . *Right (b):* Using MFS observations with 8 frequencies spread over 25%.

# Multi-frequency deconvolution

- But there is a problem if the source flux density changes with frequency...
- Need what is called multi-term multi-frequency synthesis (MTMFS) imaging.
- Takes spectral variation of sky brightness distribution into account during deconvolution using linear Taylor series approximation.





# Multi-frequency deconvolution

- $B_\nu(l, m)$  represents the sky emission in terms of a Taylor series about a reference frequency:

$$B_\nu = \sum_{t=0}^{N_t-1} b_\nu^t B_t^{\text{sky}} \text{ where } b_\nu^t = \left( \frac{\nu - \nu_0}{\nu_0} \right)^t$$

- A good practical choice is a power law model of the sky:

$$B_\nu^{\text{sky}} = B_{\nu_0}^{\text{sky}} \left( \frac{\nu}{\nu_0} \right)^{B_\alpha^{\text{sky}} + B_\beta^{\text{sky}} \log\left(\frac{\nu}{\nu_0}\right)}$$

- Additional terms can be added depending on the sky model.

# Sparse reconstruction - compressed sensing methods

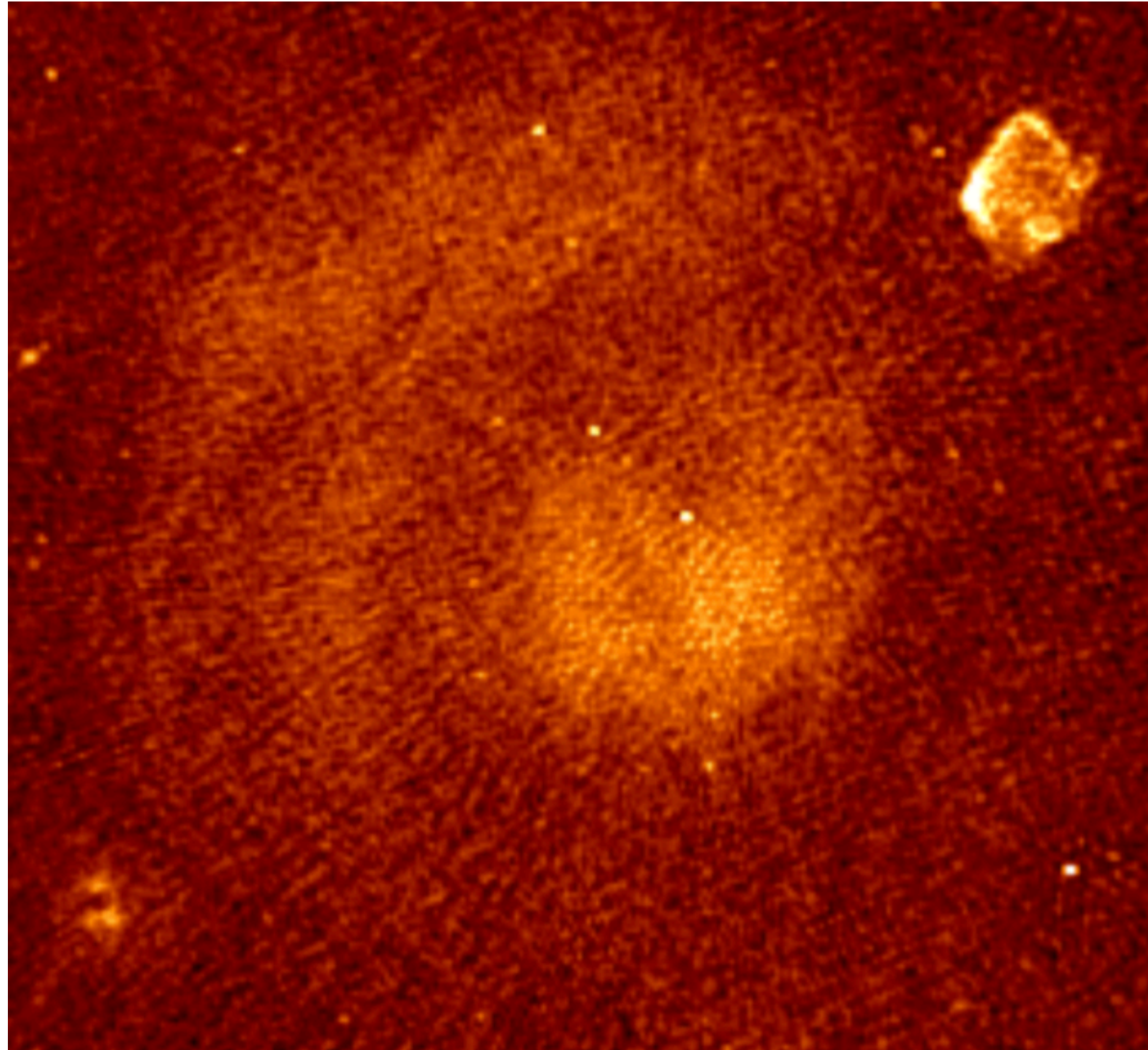


Image credit - A. Offringa



# Compressed sensing

- Model with CS



Image credit - A. Offringa

# Compressed sensing

- Model with multi-scale

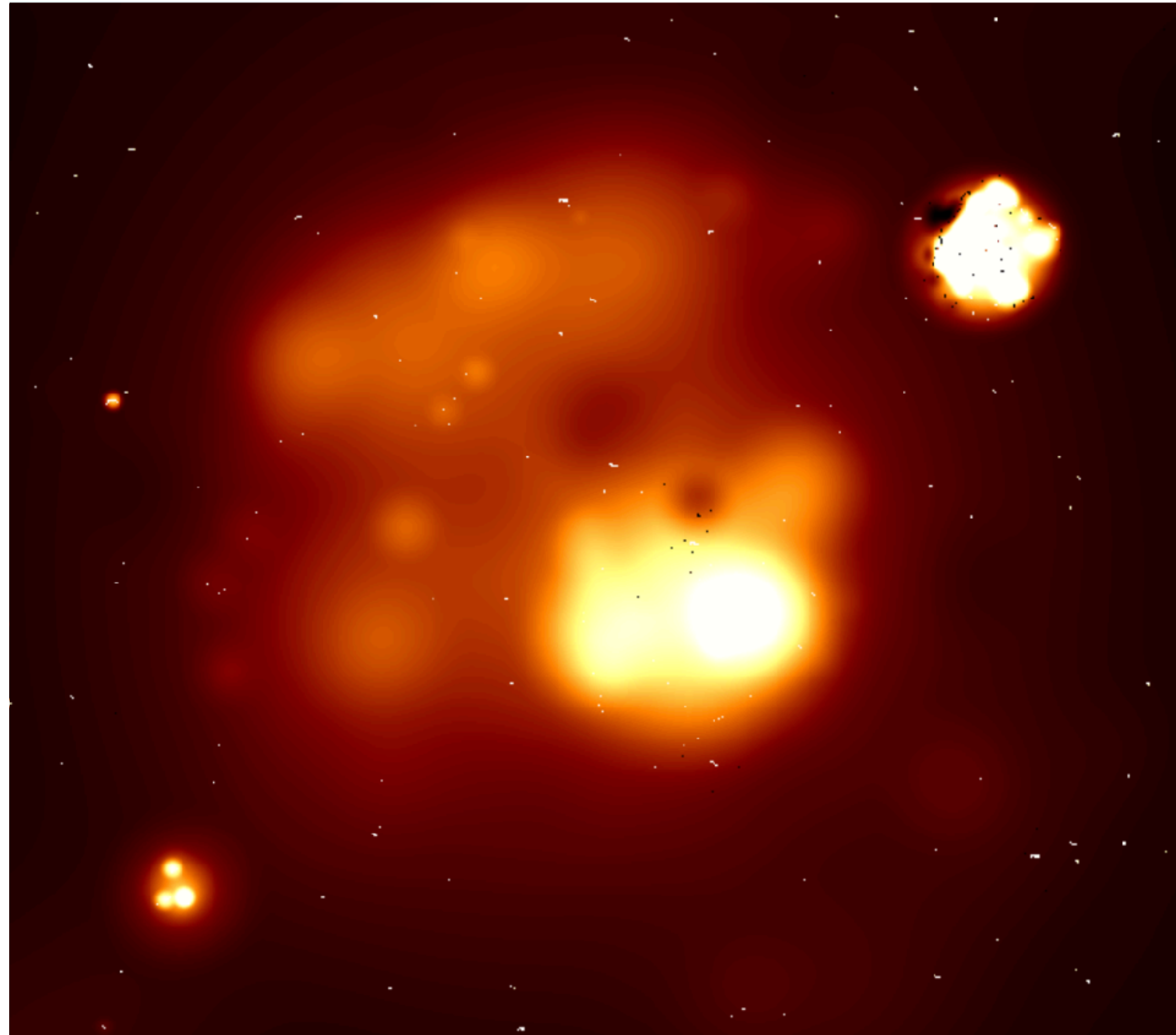


Image credit - A. Offringa



# Direction-dependent effects

- To the RIME, we had the corrupting effects being parameterised as a Jones chain:

$$\mathbf{V}_{pq} = \iint_{lm} \mathbf{J}_p \frac{\mathbf{B}(l, m)}{n} \exp \left\{ -2\pi i \left[ u_{pq} l + v_{pq} m + w_{pq} (n - 1) \right] \right\} \mathbf{J}_q^H \, dl dm$$

$$\mathbf{V}_{pq} = \iint_{lm} \mathbf{J}_p \mathbf{K}_p \mathbf{B}(l, m) \mathbf{K}_q^H \mathbf{J}_q^H \, dl dm$$

- Can be split into direction-independent ( $\mathbf{G}$ ) and direction-dependent effects, DDEs ( $\mathbf{E} = \mathbf{E}(l, m)$ )

$$\mathbf{V}_{pq} = \mathbf{G}_p \left( \iint_{lm} \mathbf{E}_p \mathbf{K}_p \mathbf{B}(l, m) \mathbf{K}_q^H \mathbf{E}_q^H \, dl dm \right) \mathbf{G}_q^H$$

- These  $\mathbf{E}$  terms causes your interferometer to effectively ‘see’ a different sky on each baseline and can cause errors. Most are calibrated away through observational design / strategies (e.g., phase referencing).
- Some are not, and can change over your field-of-view...

# Wide-field imaging

- First direction dependent effect is the non-coplanar term (or the  $w$ -term),



$$V(u, v, w) = \iint_{lm} \frac{B(l, m)}{n} \exp \left\{ -2\pi i [ul + vm + w(n - 1)] \right\} dl dm$$

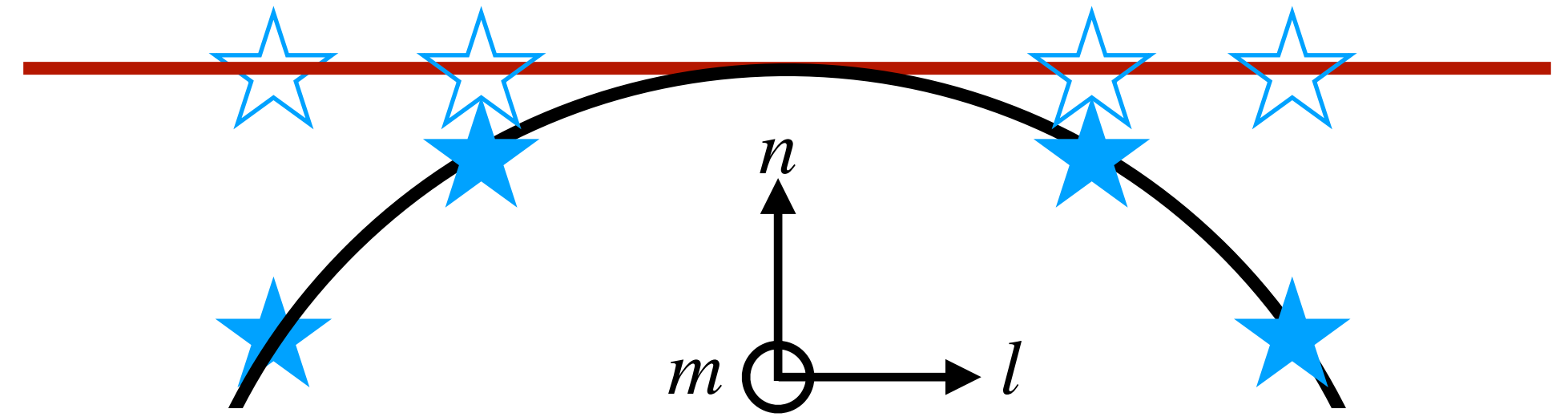
$$\rightarrow V(u, v, w) = \iint_{lm} W \frac{B(l, m)}{n} \exp \left\{ -2\pi i [ul + vm] \right\} dl dm \quad \text{where} \quad W = \exp [w(n - 1)]$$

- 3D visibility function  $V(u, v, w)$  can be transformed into a 3D image volume  $B(l, m, n)$  but non-physical as only  $l, m$  are directional cosines (i.e., 2D)
- Our lovely 2D Fourier transform now does not hold...



# Wide-field imaging - 3D to 2D

- The only non-zero values of  $I$  lie on the surface of a sphere of unit radius defined by  $n = \sqrt{1 - l^2 - m^2}$
- The sky brightness consisting of a number of discrete sources  are transformed onto the surface of this sphere.
- The two-dimensional image  is recovered by projection onto the tangent plane at the pointing centre



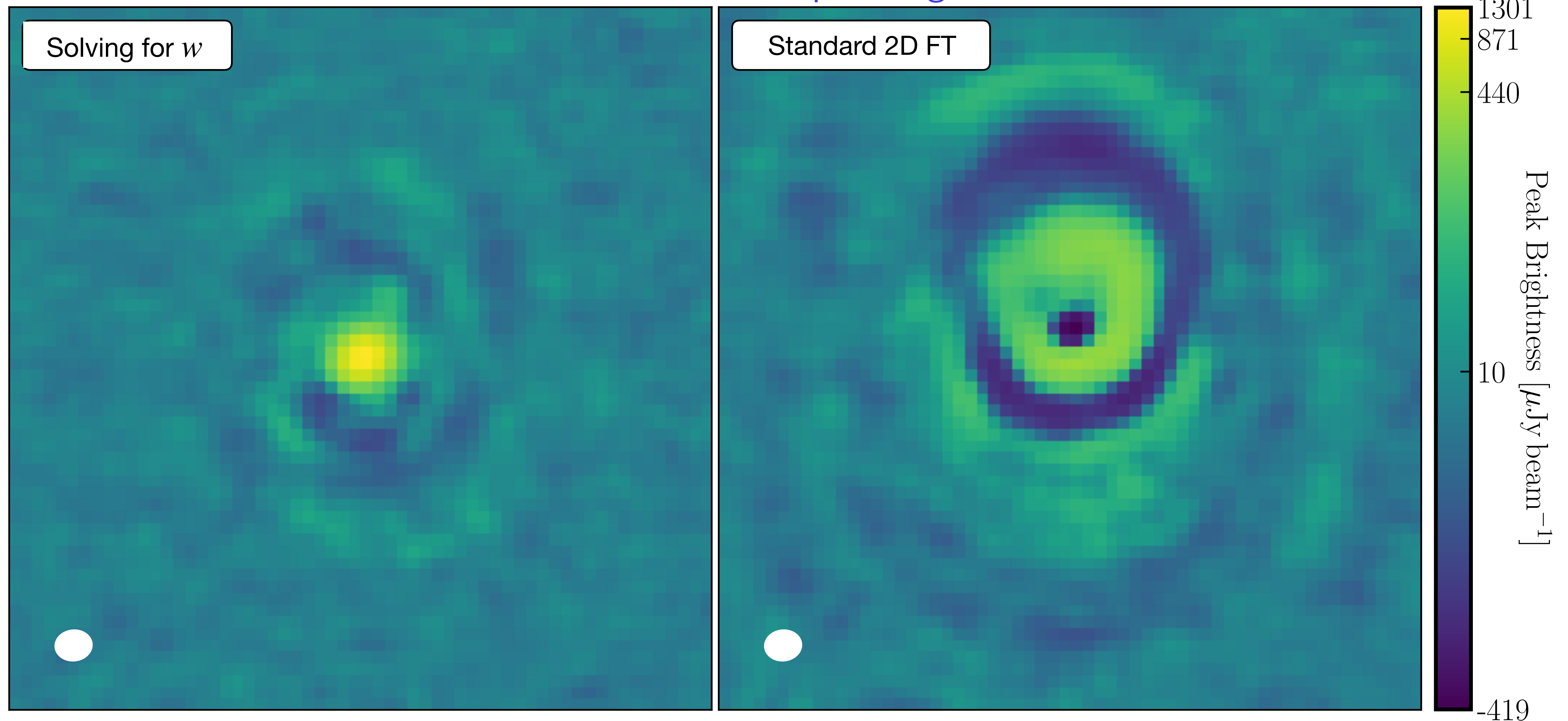
How do we achieve this?

1. Faceting - split field into multiple projected images and stitch together
2. Deal with the  $w$ -term directly (deal with the distortion when imaging)

# Distorting the images

- If you don't deal with the  $w$ -term:

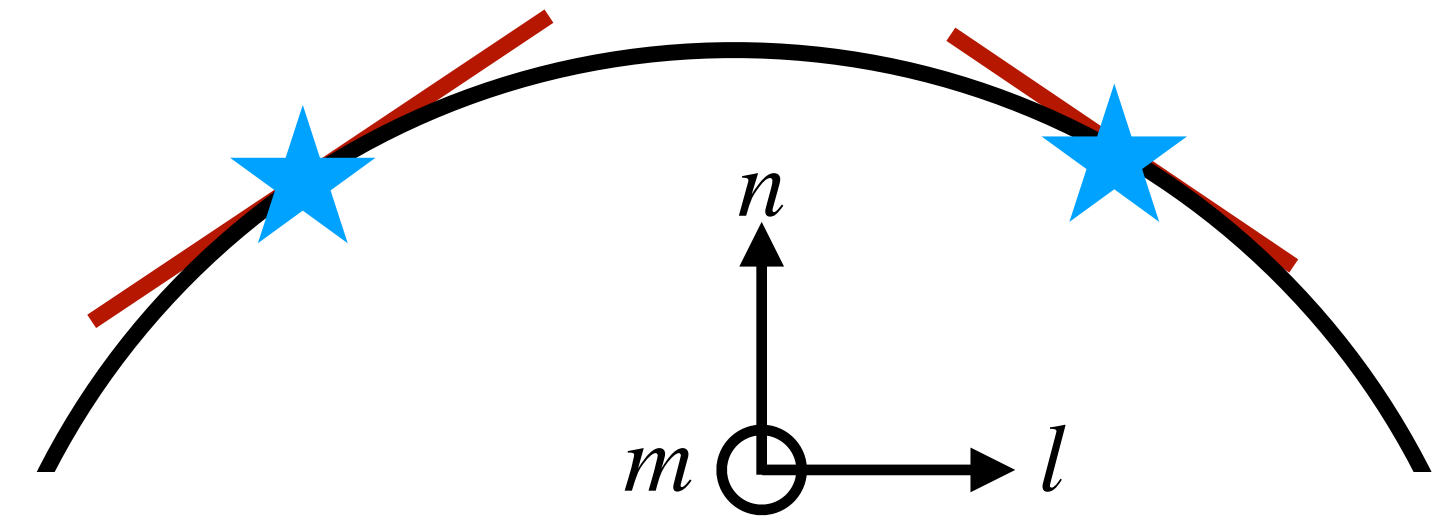
e-MERLIN - source 7.5' from pointing centre





# 1. Faceting

- Oldest method in the book - takes advantage of small-field approximation ( $l, m \rightarrow 0$ ) so  $W \sim 1$  so our image sphere is approximated by pieces of smaller tangent planes.
- Result  $\rightarrow$  each sub-field can use the standard 2D FFT!
- Errors increase quadratically away from centre but ok if enough sub-fields are selected
- Facets can be chosen to cover known sources or overlap to complete coverage of primary beam



## 2. Dealing with $w$ directly

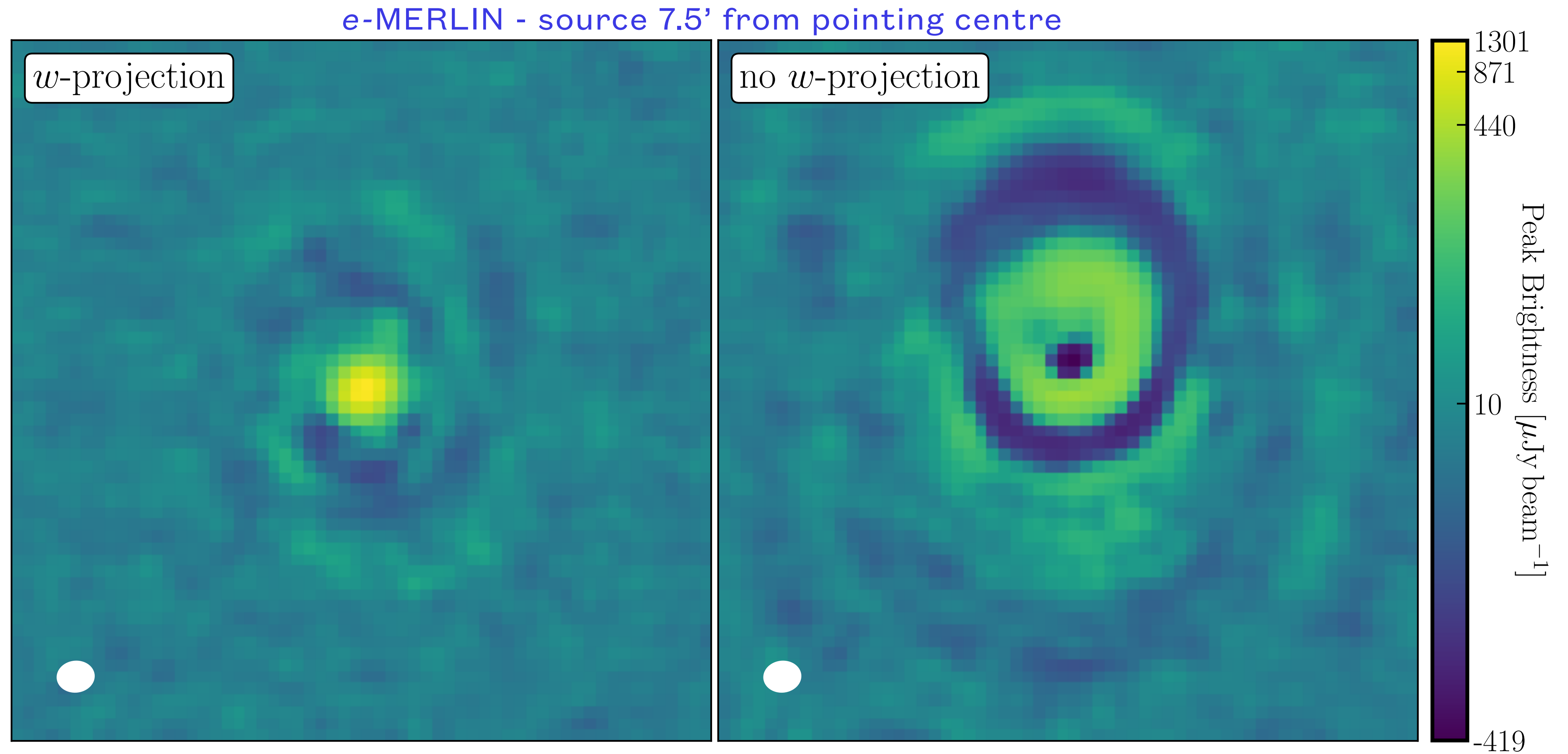
- Other algorithms allow you to deal with the  $w$ -term directly when imaging (to produce a contiguous image). Examples include  $w$ -stacking and  $w$ -projection (shown next).
- To return the visibility equation to a 2D Fourier transform, the  $w$ -projection algorithm convolves the visibilities with the  $w$ -term i.e.,

$$V(u, v, w = 0) * \mathcal{F} \left( \exp \left[ -2\pi i w (n - 1) \right] \right) = \iint_{lm} \frac{B(l, m)}{n} \exp \left[ -2\pi i (ul + vm) \right] dl dm$$

- Dependent on zenith angle, coplanarity of array and FoV.
- Deconvolution assumes constant PSF but PSF slightly changes over the image so **Cotton-Schwab algorithm** automatically used to correct for this.

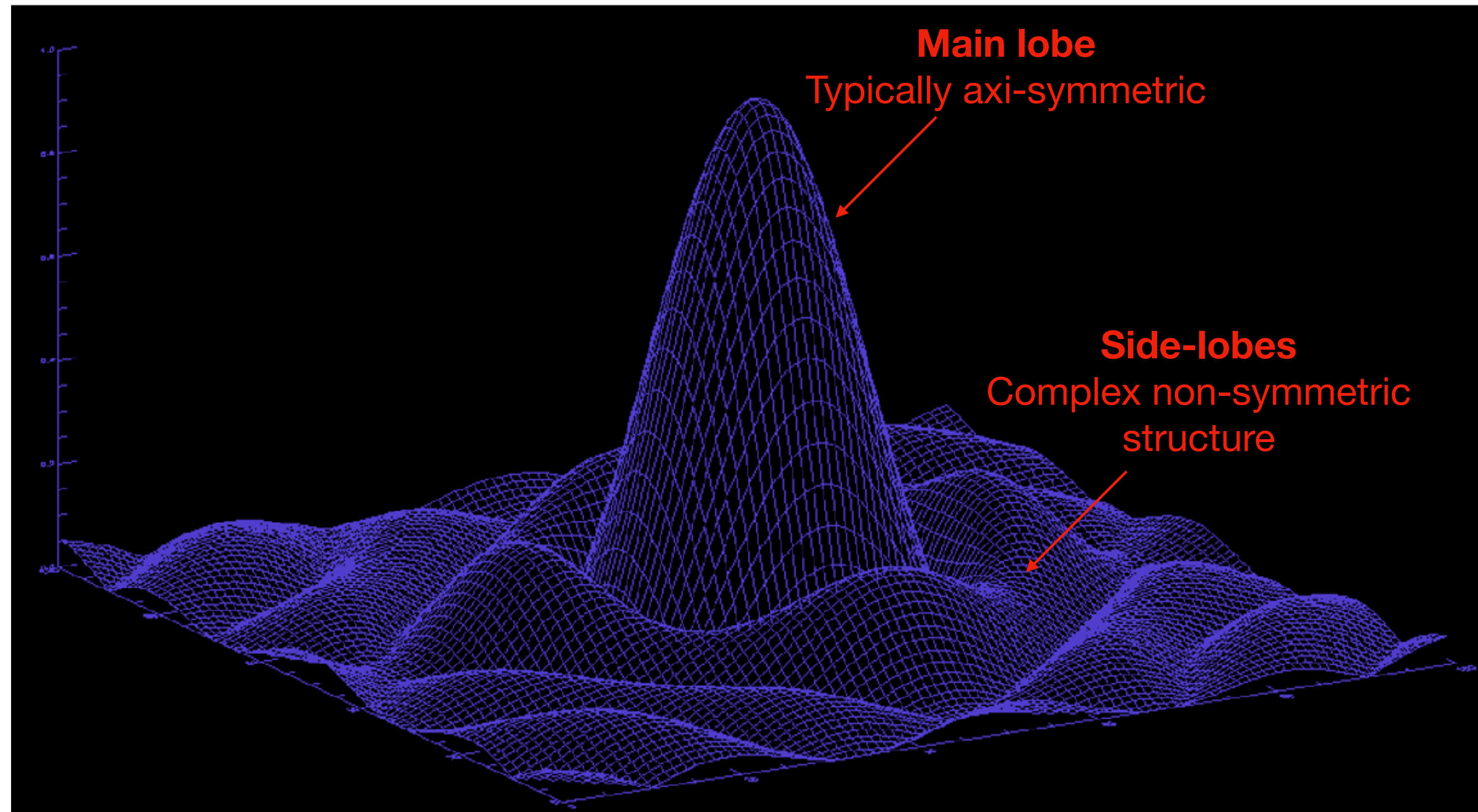


# Distorting the images



# The primary beam

- The most ubiquitous DDE is the **primary beam response**. This is different from the PSF / synthesised beam and is related to the diffraction response of your individual antennae (i.e.,  $\lambda/D$  not  $\lambda/B$ )!



Primary beam response of the e-MERLIN Knockin station



# Correcting for the primary beam

- For an axisymmetric scalar/power beam  $A$  and a homogeneous array, e.g., within the main lobe:

$$V_{pq} = \iint_{lm} A_p K_p B(l, m) K_q^H A_q^H dl dm$$

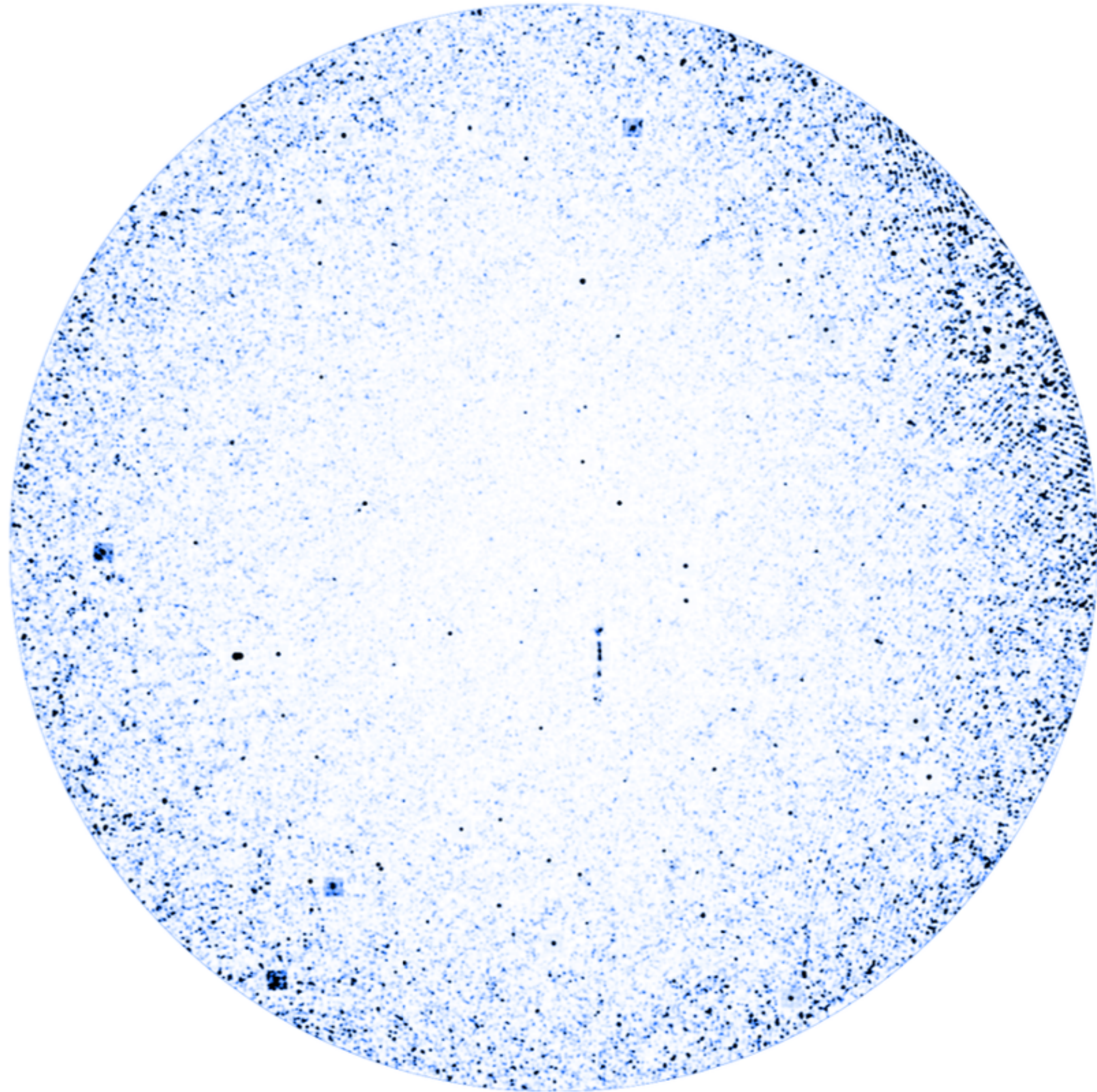
- As all  $A$  are the same on each baseline then the apparent sky is the same (hence can grid on one  $uv$  plane:

$$V = \iint_{lm} |A(l, m)|^2 K_p B(l, m) K_q^H dl dm$$

- FT'ing as in imaging gives our recovered sky as  $|A(l, m)|^2 |B(l, m)|$  so we can recover the true sky by **multiplying our image by the inverse of the power beam** (voltage beam of your radio telescope squared)



# Example of primary beam correction



Primary beam corrected  
JVLA+MERLIN image of the  
GOODS-N deep field

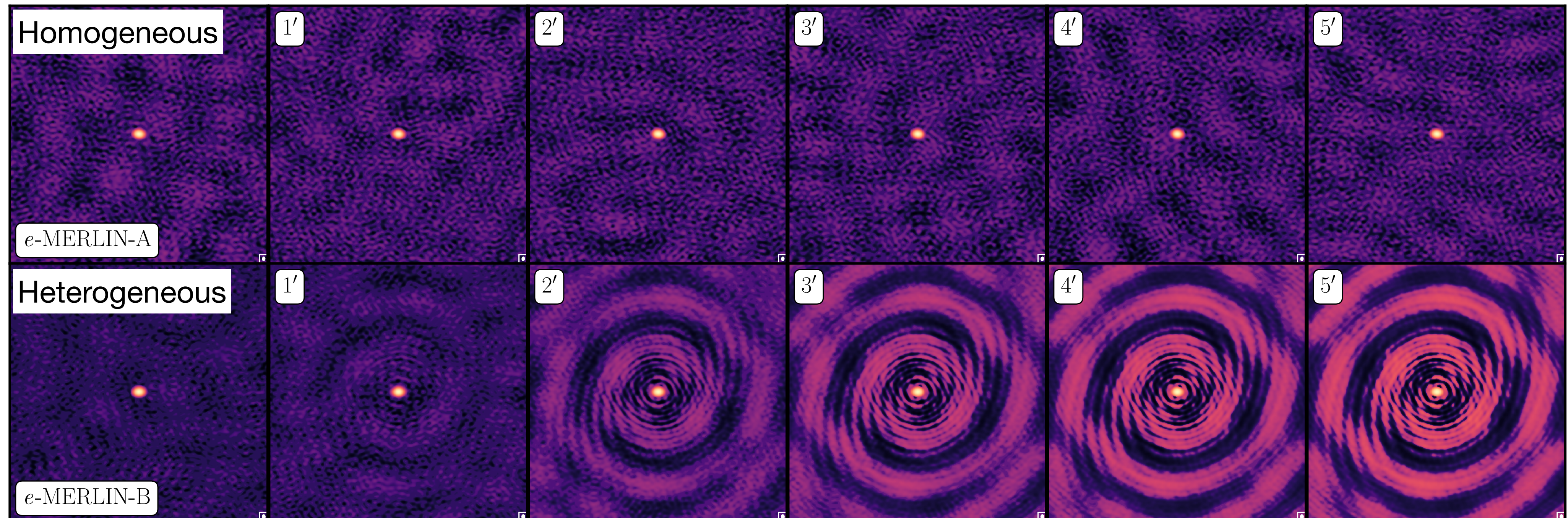
Note the increased noise level  
towards the edge of the field



# Variable and heterogeneous primary beams

- So what happens away from the main lobe or if you have complex structure in your primary beam?

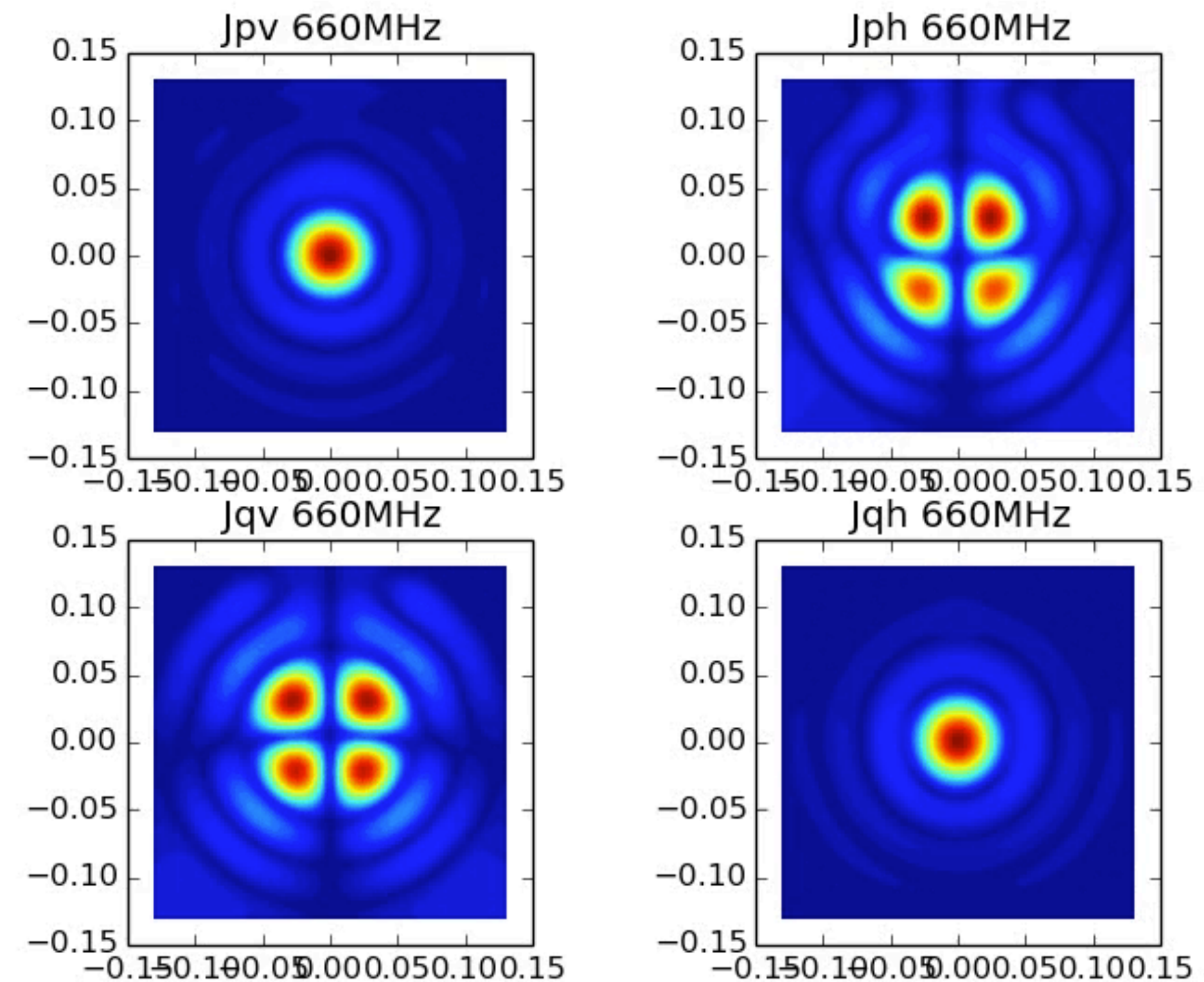
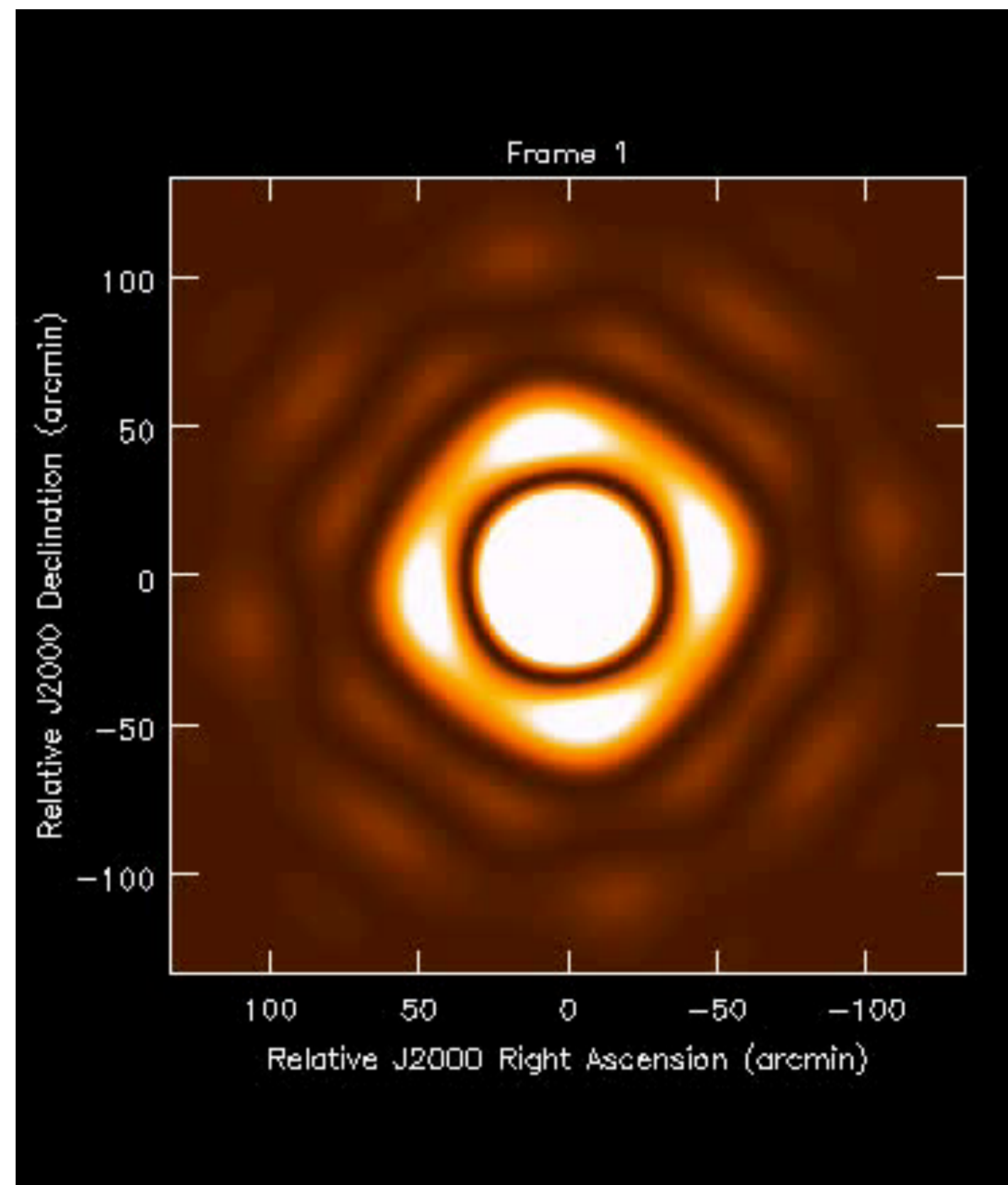
- Assumption of same effective sky  $V_{pq} = \iint_{lm} A_p K_p B(l, m) K_q^H A_q^H dl dm$  being seen by each baseline breaks down and you get errors in your images





# Homogeneous arrays also fail

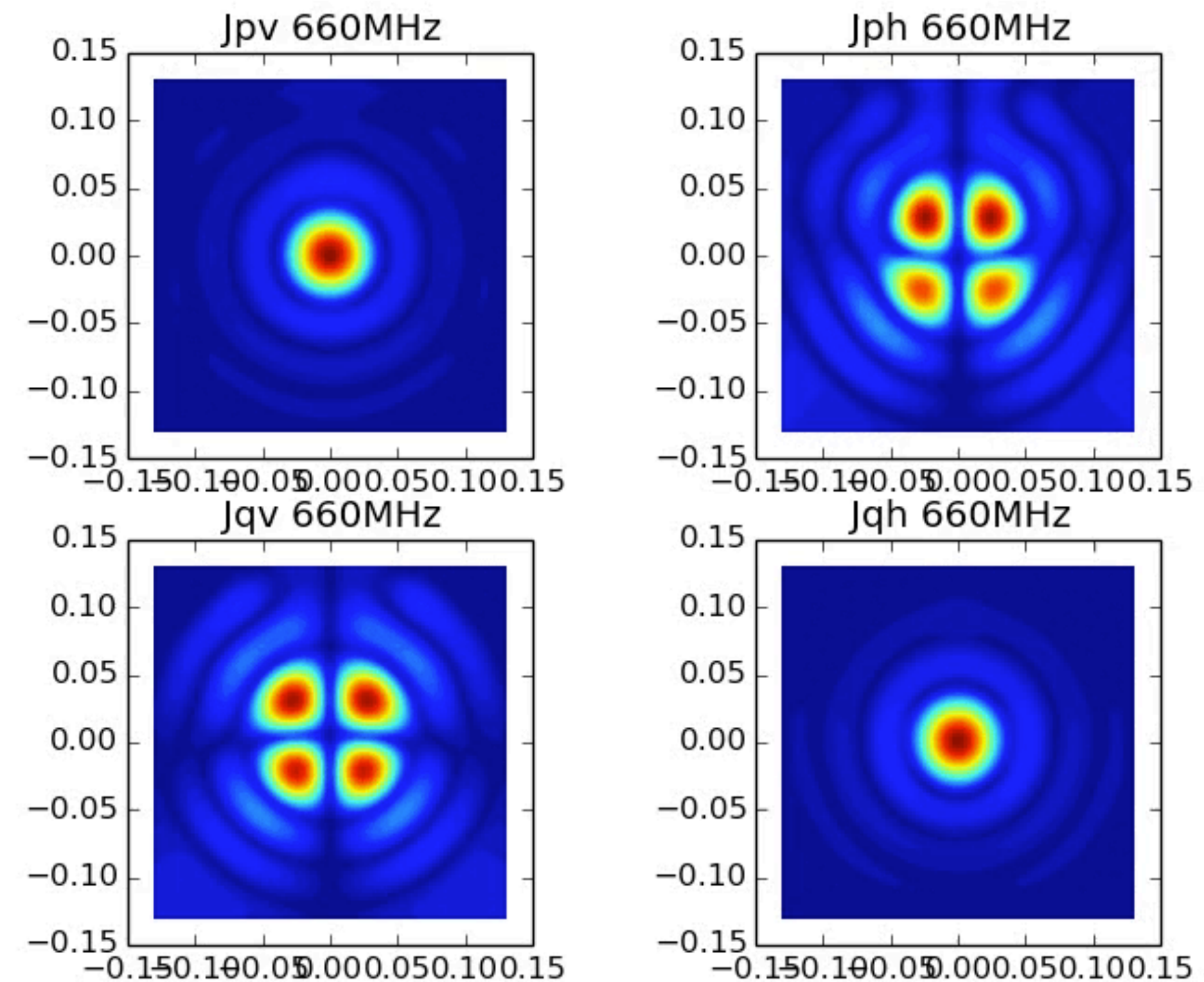
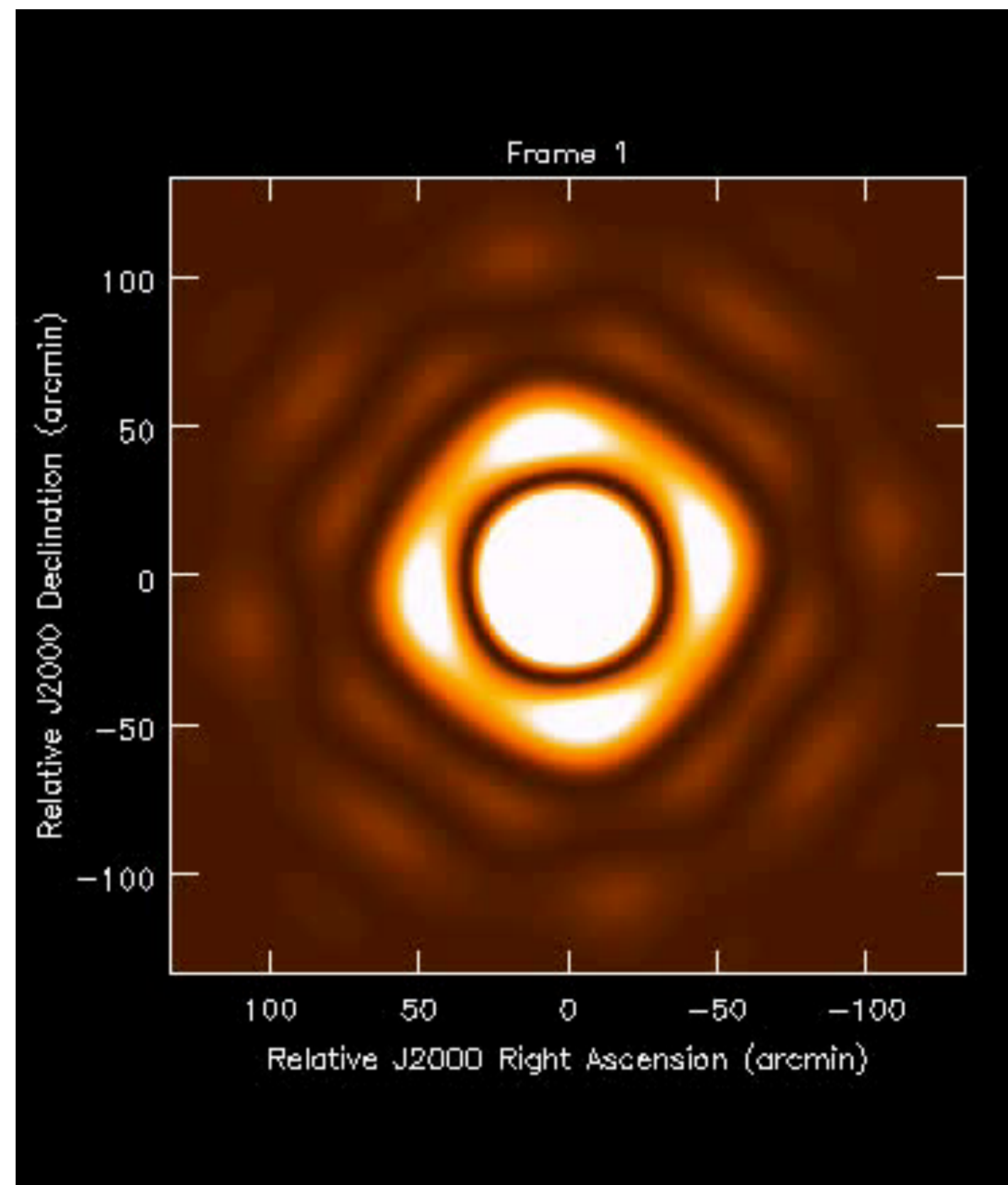
- Primary beam of all arrays can vary with time and frequency!
- Has to be accounted for during cleaning and primary beam correction if imaging the whole primary beam (normally via aw-projection).





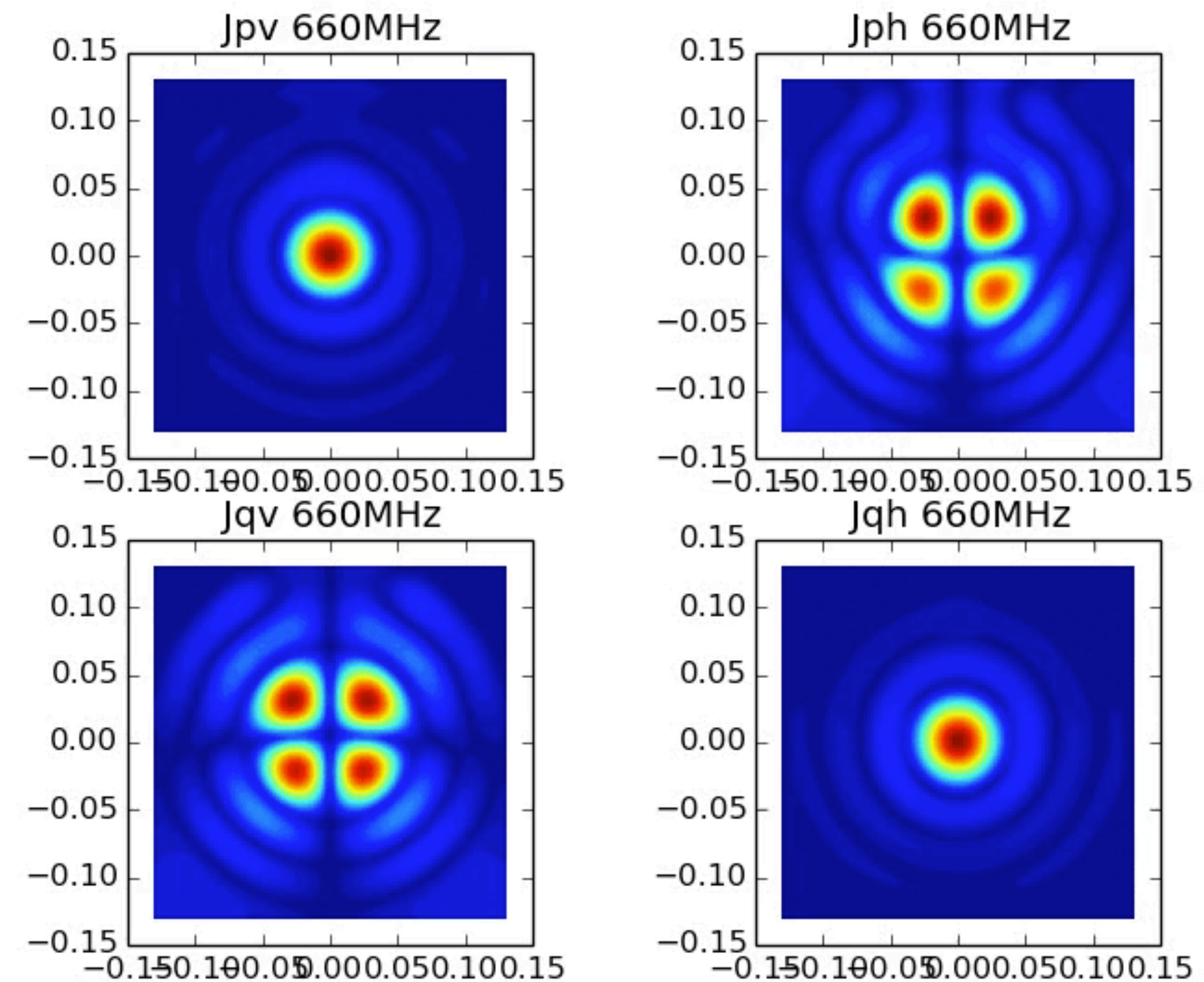
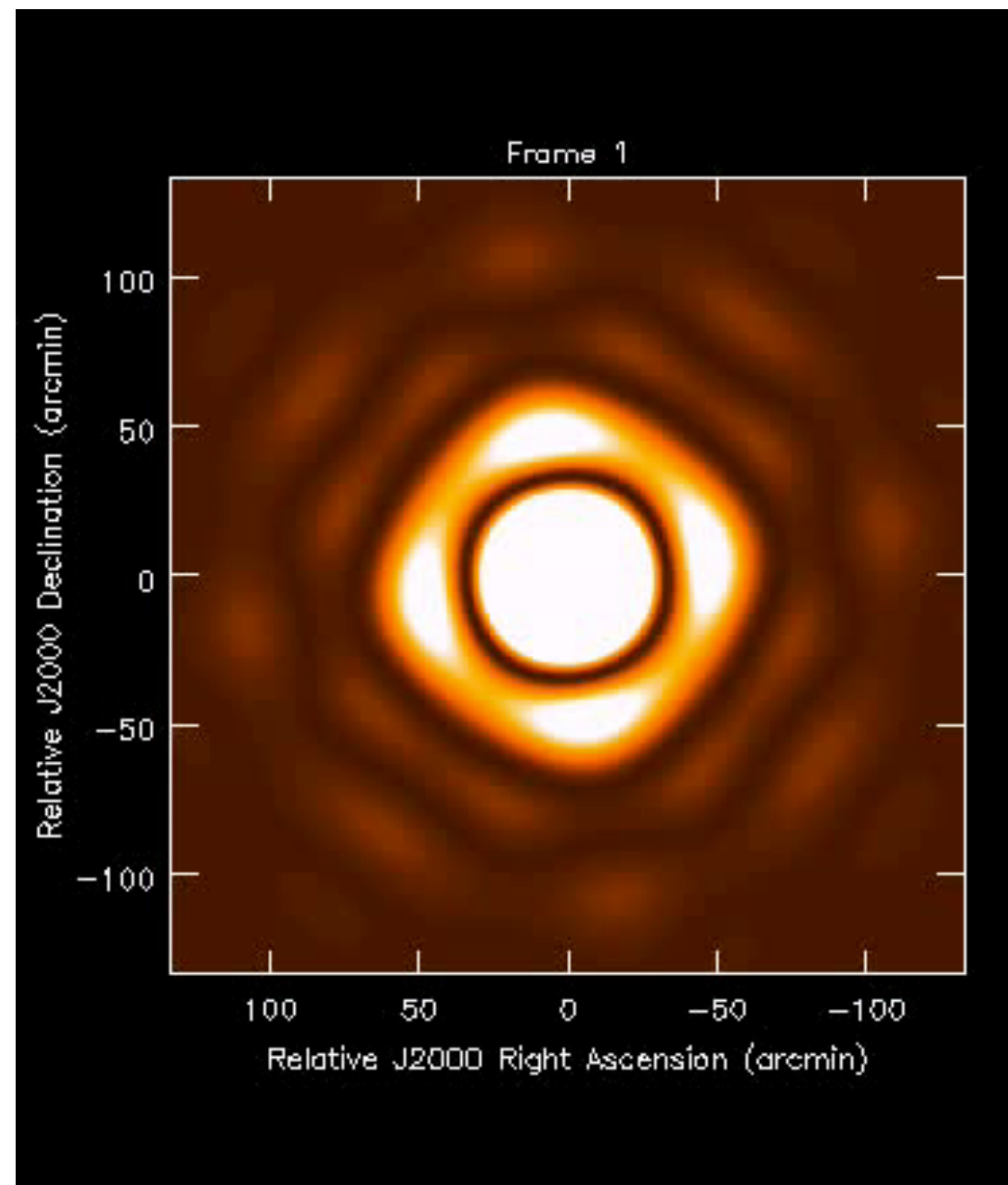
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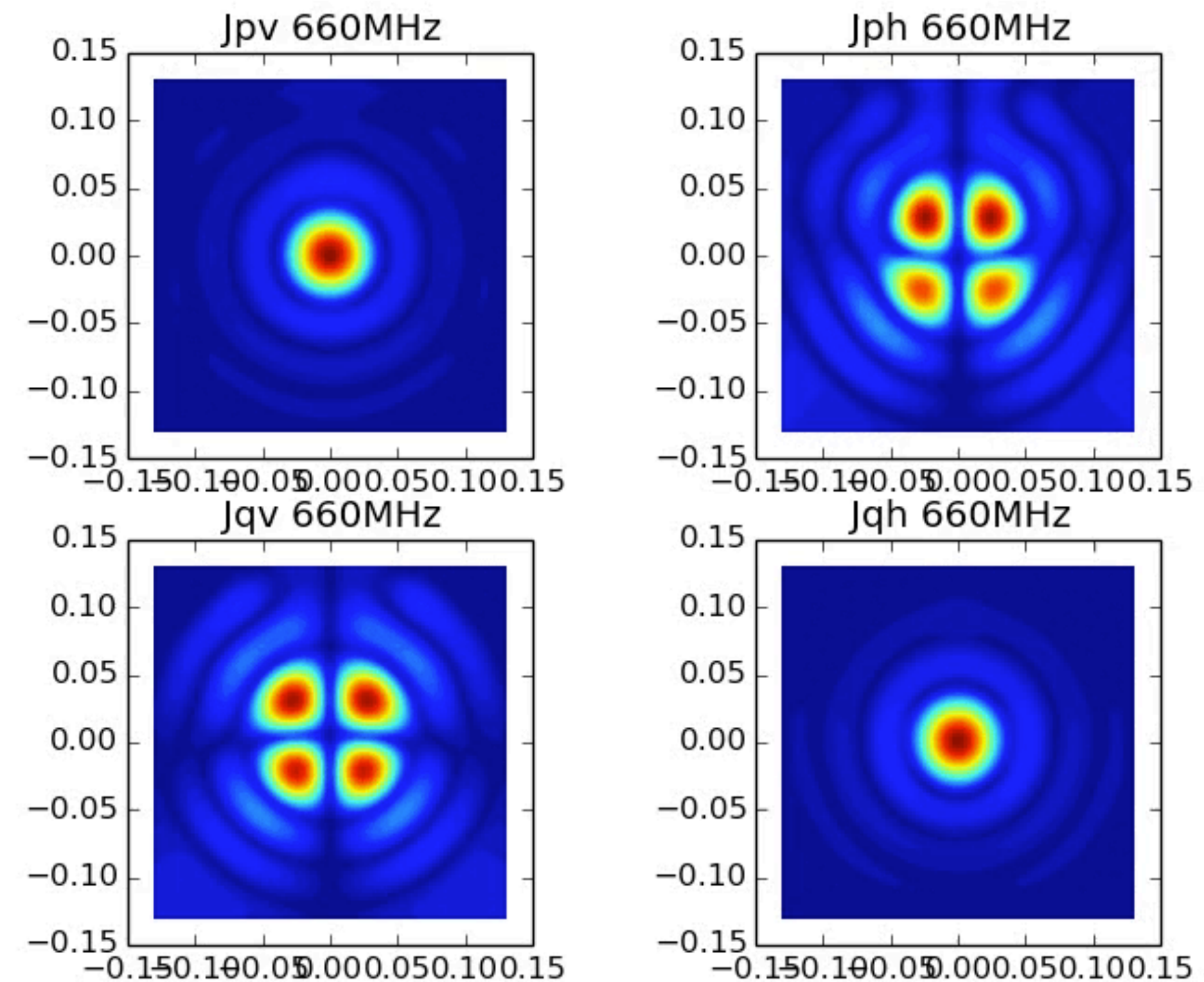
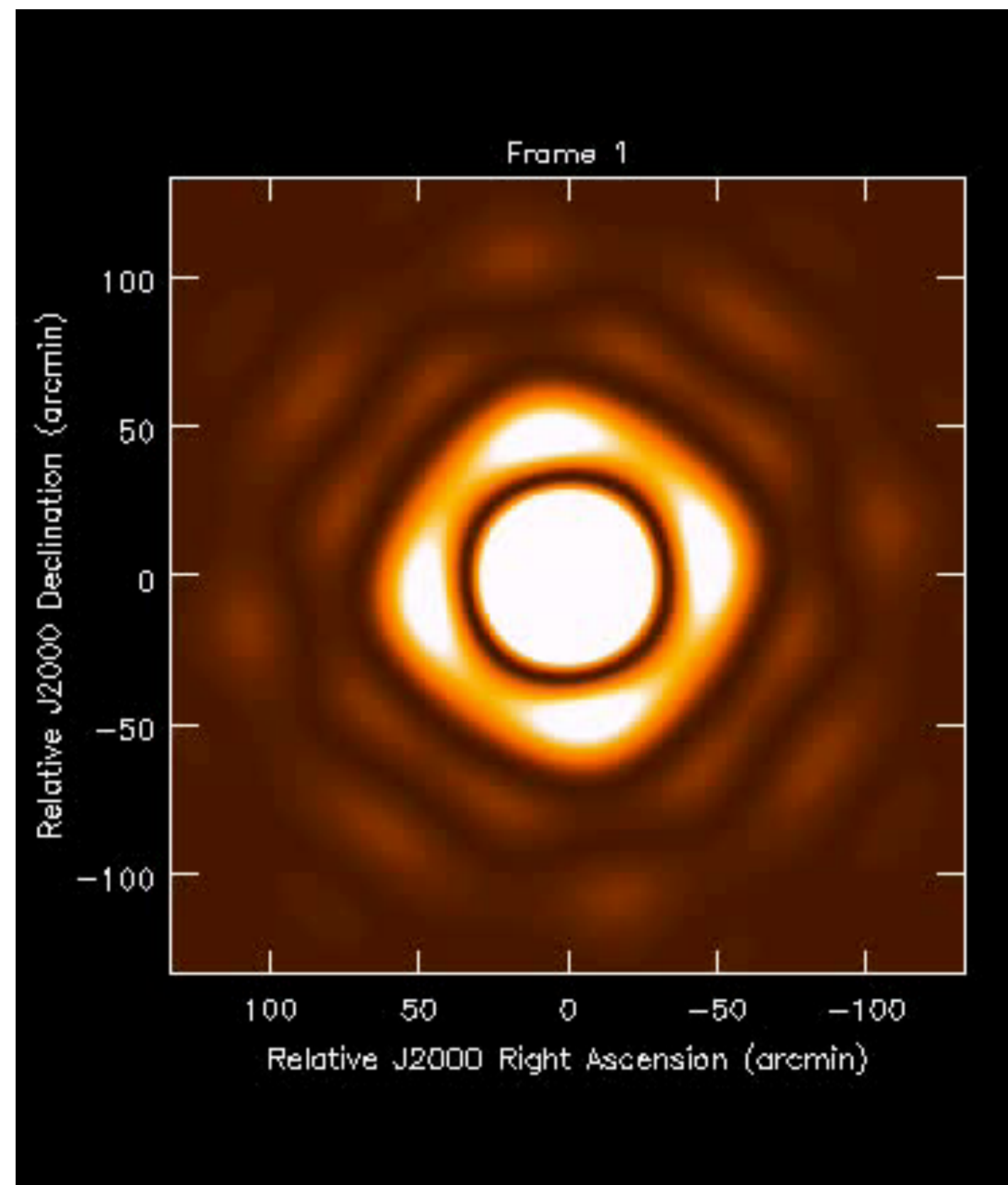
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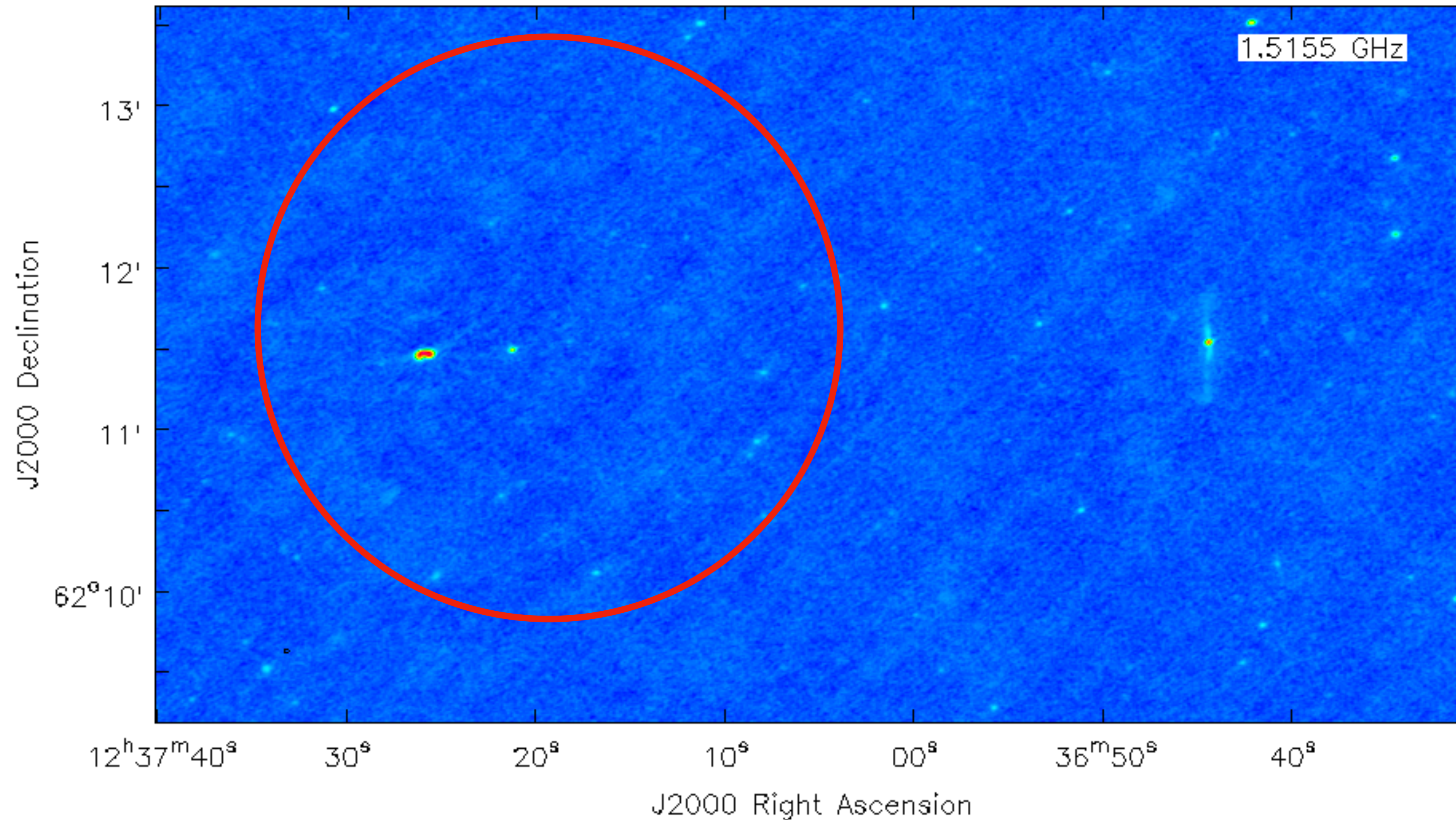
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# Mosaicking

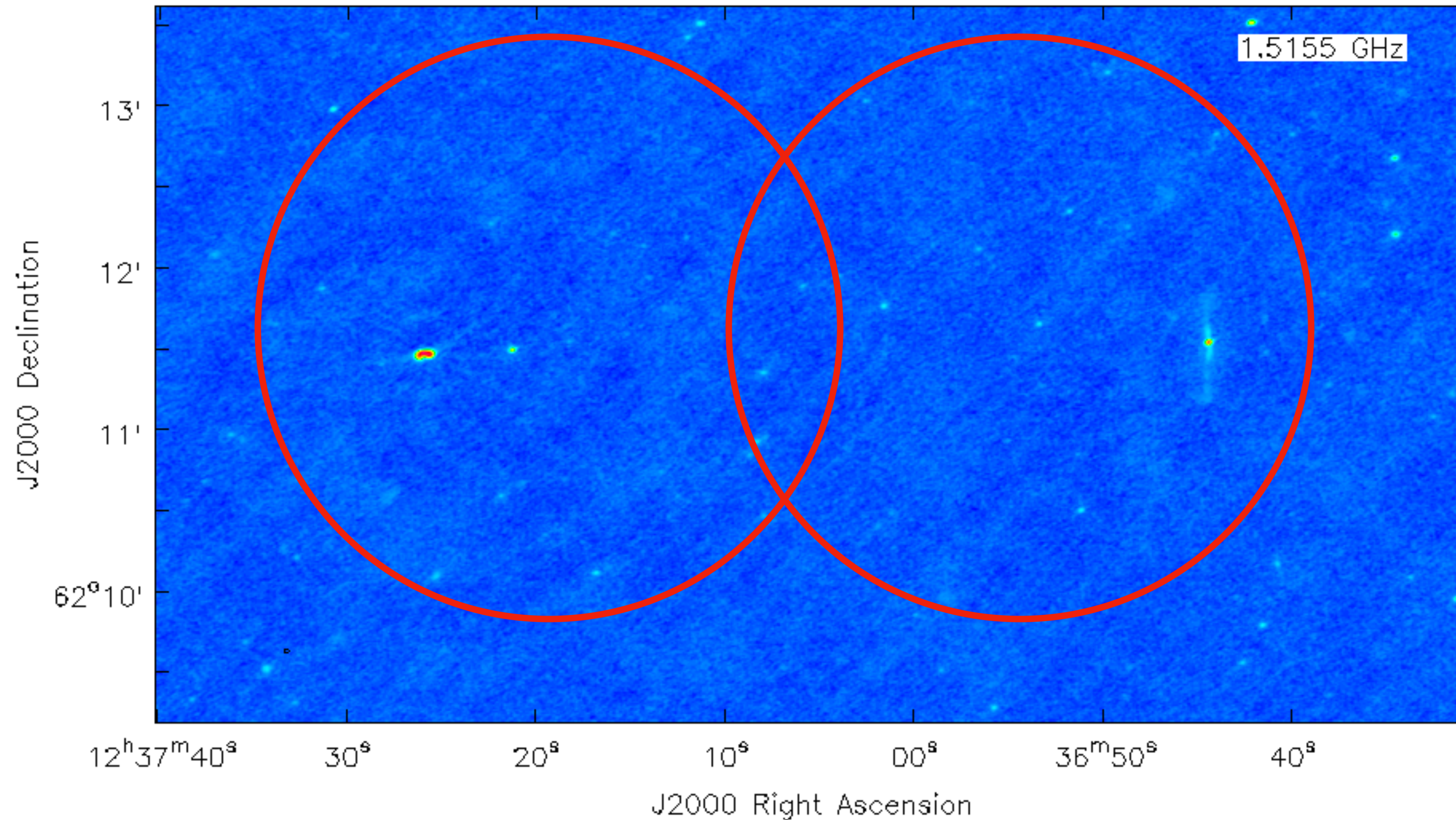
What if this is our primary beam and we want to see the FR-I galaxy too?





# Mosaicking

We can use multiple pointings and combine them with correct weighting



# Mosaicking - the math

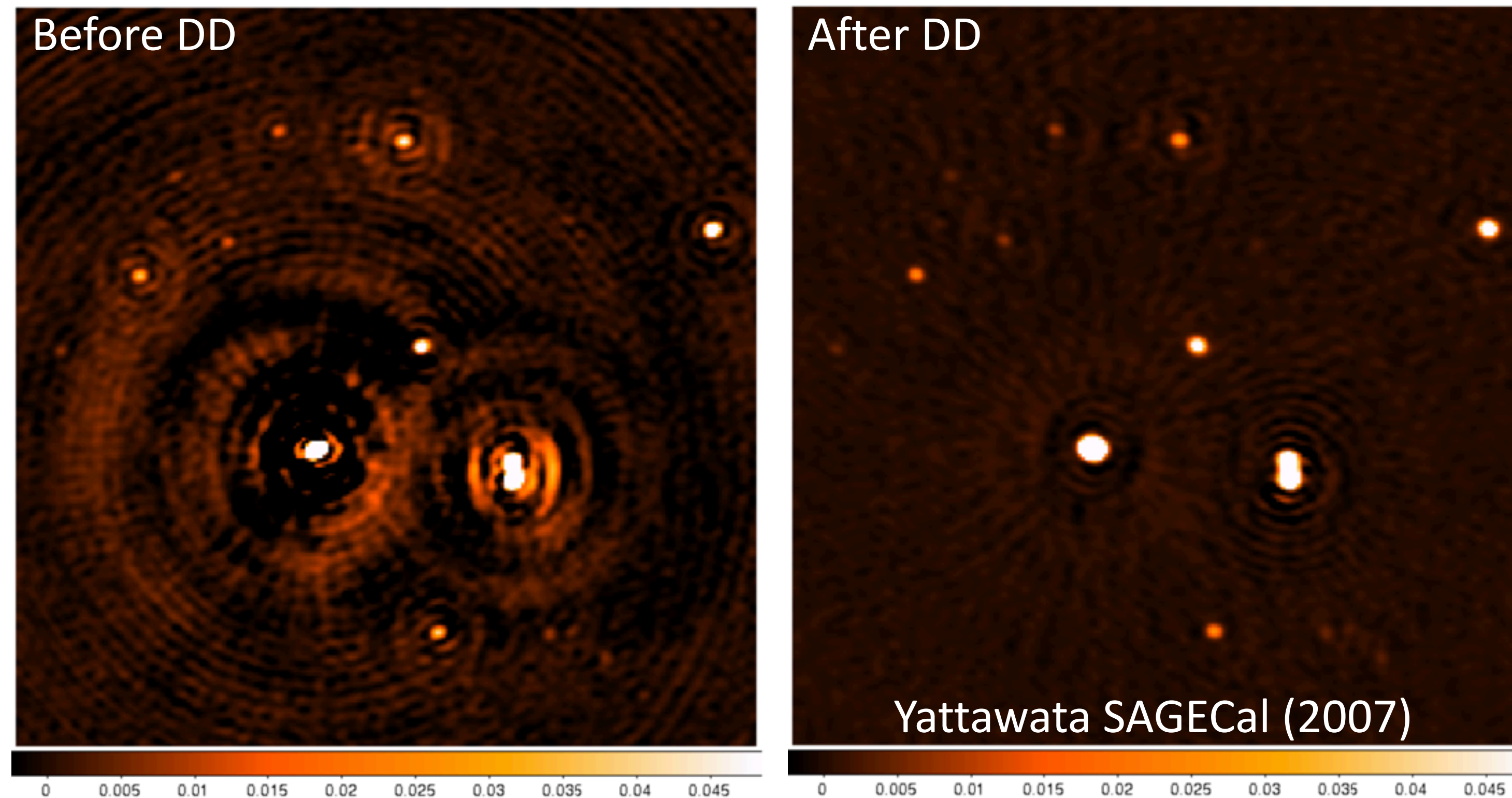
- To create the mosaicked image  $M(l, m)$
- Weight with  $1/\sigma^2$  which is just (Primary beam)<sup>2</sup> or  $A_i^2(l, m)$

$$\begin{aligned} M(l, m) &= \frac{\sum_i A_i^2(l, m) (B_i(l, m)/A_i(l, m))}{\sum_i A_i^2(l, m)} \\ &= \frac{\sum_i A_i(l, m) B_i(l, m)}{\sum_i A_i^2(l, m)} \end{aligned}$$



# Other direction-dependent calibration

- Direction dependent (DD) effects may need further corrections applied during imaging... not a fully solved problem!
- Can be ionosphere, tropospheric, instrumental (e.g. a - projection)
- Affects position, brightness & polarisation angles!



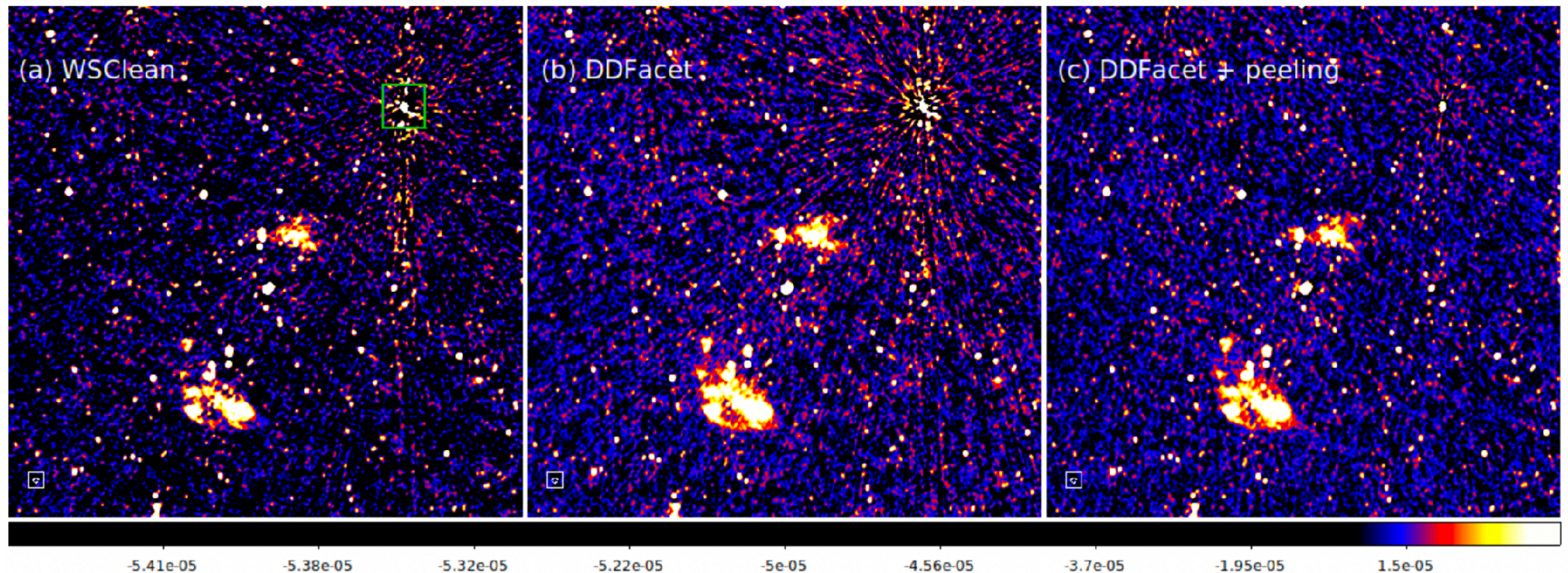


# Other direction-dependent calibration

Possible solutions:

- Image in small 'facets' where DD's effects are constant
- Peeling / direction-dependent calibration during visibility gridding

Imaging of ZwCl 2341.1+0000  
(Parekh et al. 2021)





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# Topics covered

- When to use multi-scale or other deconvolution methods
- The effect of and solution to  $w$ -terms
- Multi-term deconvolution
- Primary beam correction
- Mosaicking
- Direction-dependent effects during imaging