

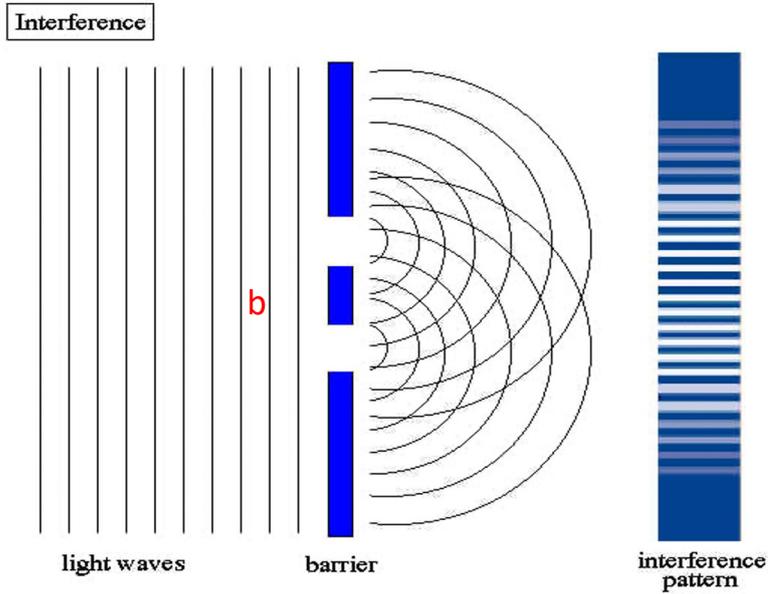


---

# Image Formation

# An interferometer is an indirect imaging device

## Young's double slit experiment



## 2D Fourier transform :

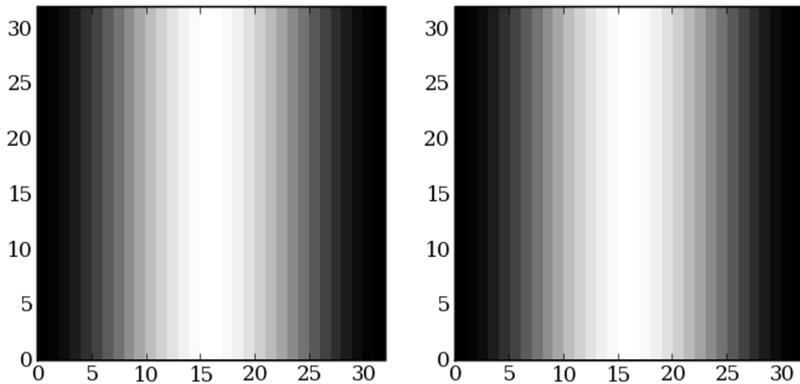
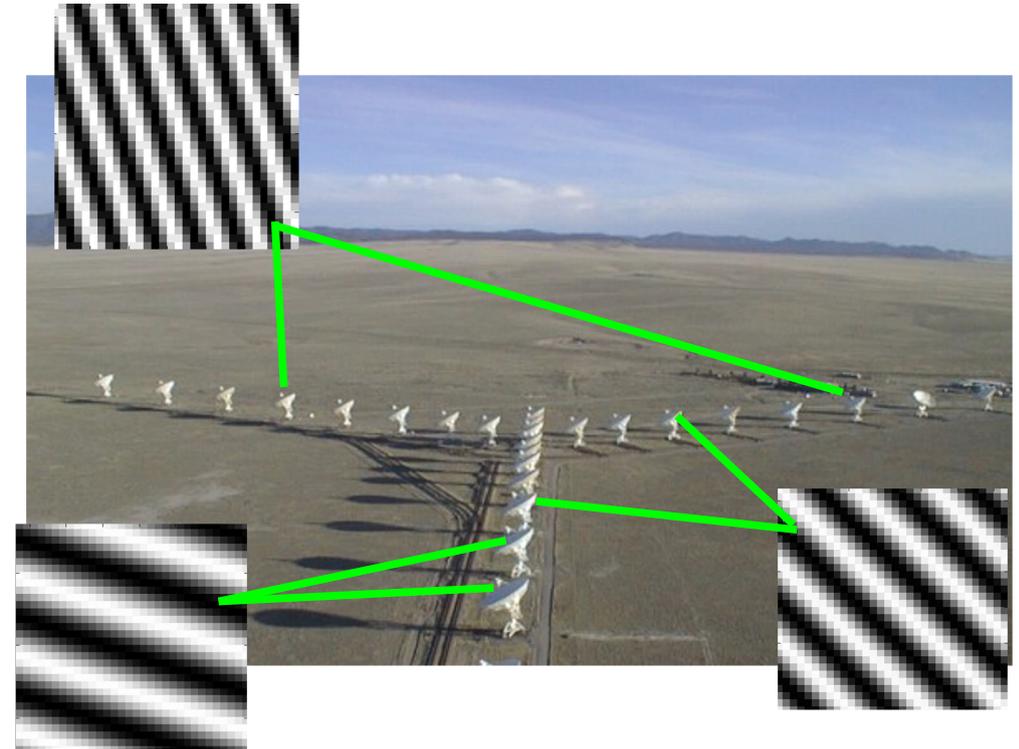


Image = sum of cosine 'fringes'.

Each antenna-pair measures the parameters of one 'fringe'.



Measured Fringe Parameters :

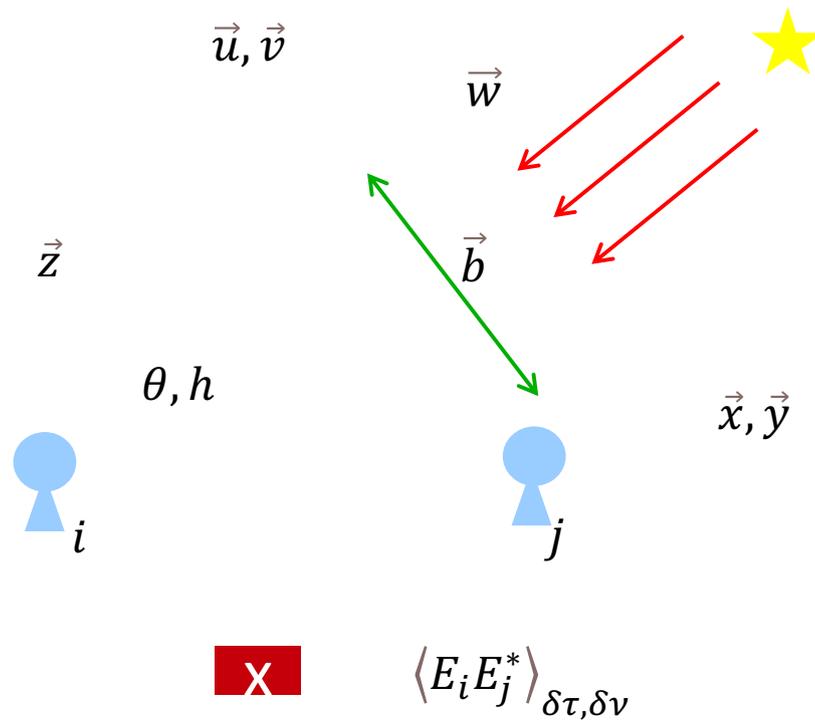
Amplitude, Phase

Orientation, Wavelength

# Measurements

Measure the spatial correlation of the E-field incident at each pair of antennas

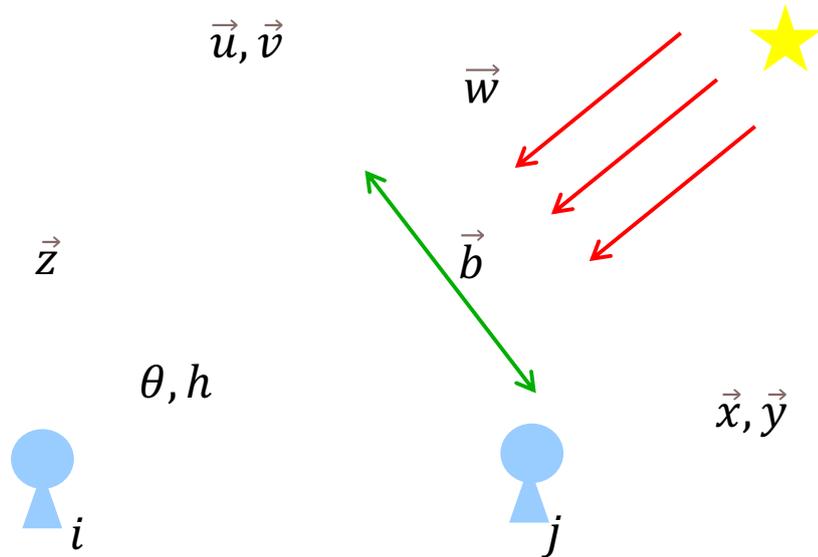
$$\langle E_i E_j^* \rangle \propto V_{ij}(u, v) = \iint I^{sky}(l, m) e^{2\pi i(ul + vm)} dl dm$$



# Measurements

Measure the spatial correlation of the E-field incident at each pair of antennas

$$\langle E_i E_j^* \rangle \propto V_{ij}(u, v) = \iint I^{sky}(l, m) e^{2\pi i(ul + vm)} dl dm$$



$$\langle E_i E_j^* \rangle_{\delta\tau, \delta\nu}$$



Parameters of a Fringe :

Amplitude, Phase :

$\langle E_i E_j^* \rangle$  is a complex number.

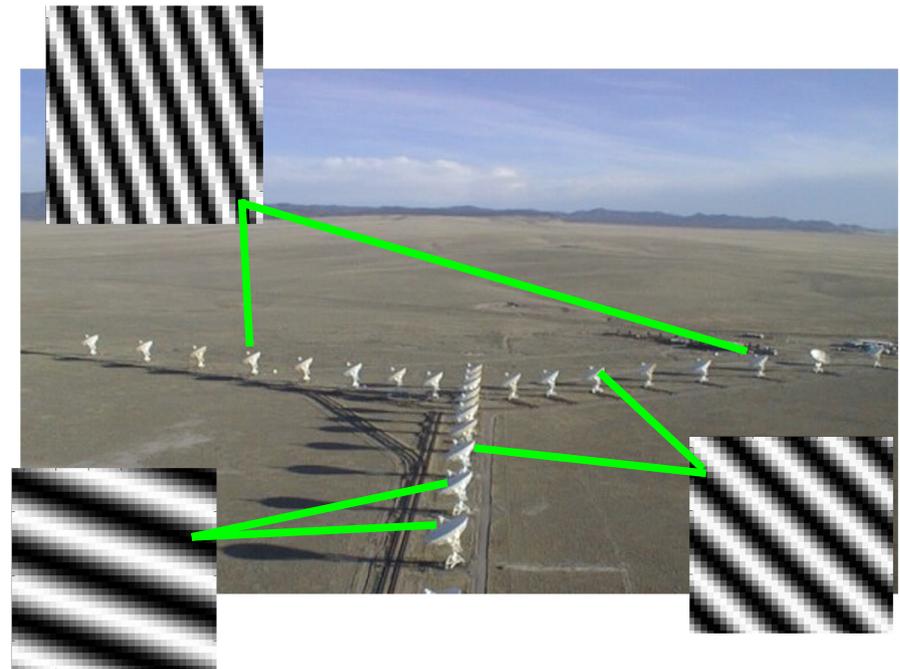
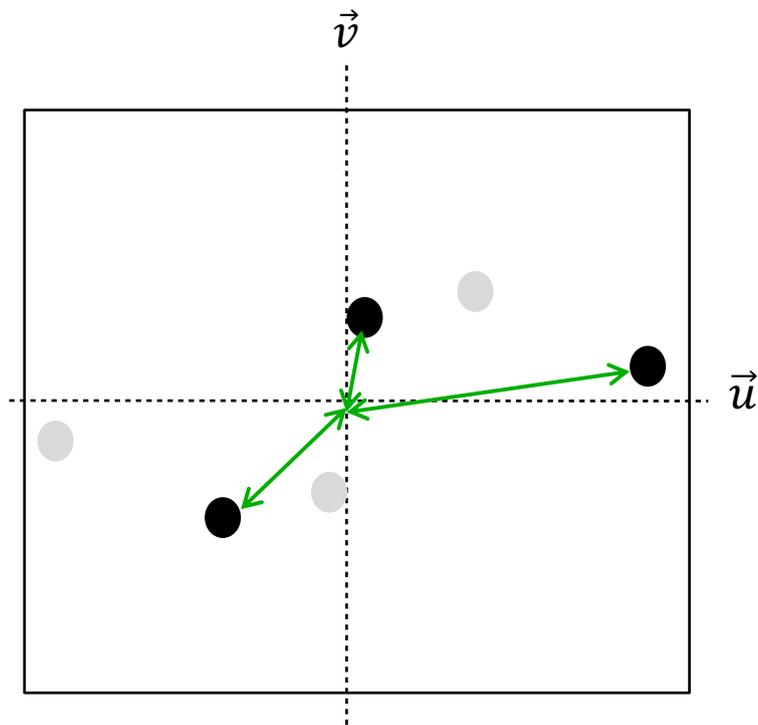
Orientation, Wavelength :

$\vec{u}, \vec{v}, \vec{b}$  (geometry)

# Measurements

Measure the spatial correlation of the E-field incident at each pair of antennas

$$\langle E_i E_j^* \rangle \propto V_{ij}(u, v) = \iint I^{sky}(l, m) e^{2\pi i(ul + vm)} dl dm$$



**UV plane : Spatial Frequency Domain**

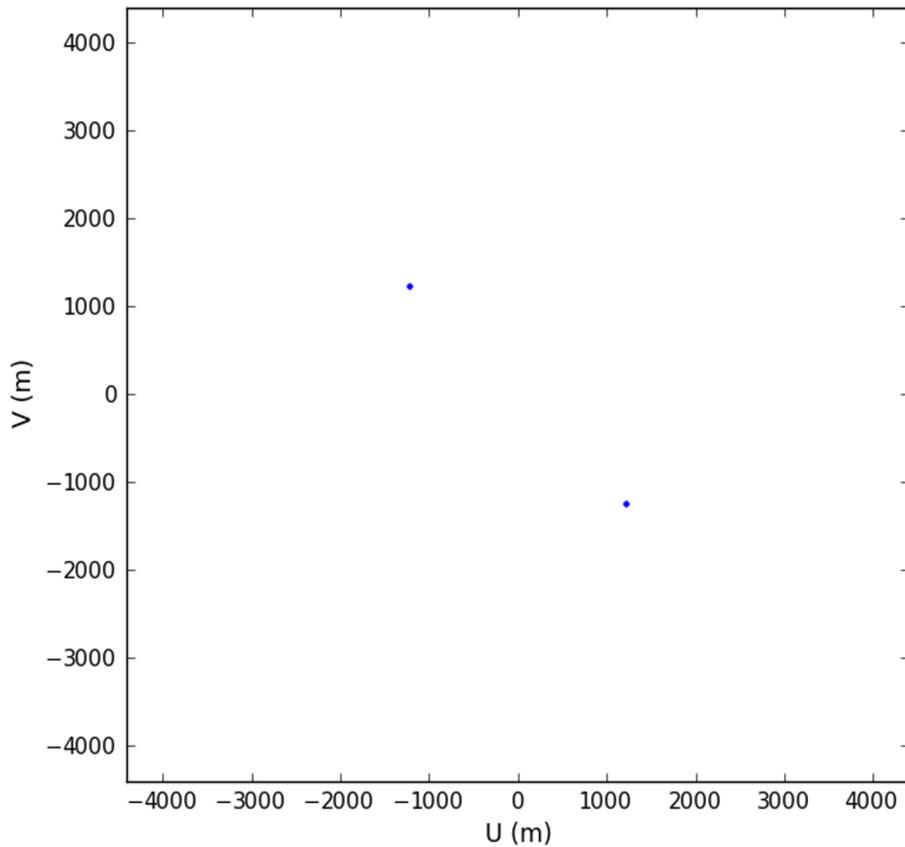
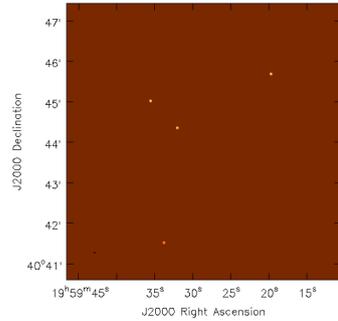
Combine measurements from multiple 'baselines' (antenna pairs) on a UV grid.

Take the inverse Fourier Transform to construct an image.

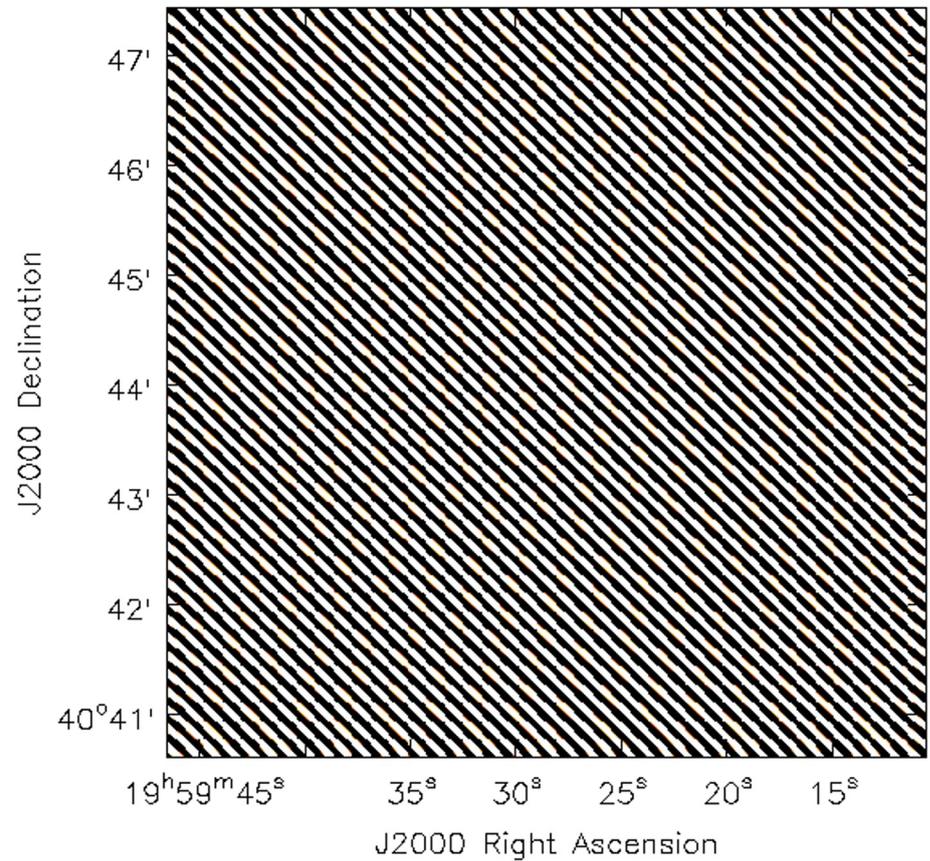
# Spatial Frequency (uv) coverage + Observed Image

$$\begin{bmatrix} u \\ v \\ w \end{bmatrix} = \frac{1}{\lambda} \begin{bmatrix} R(h, \theta) \end{bmatrix} \begin{bmatrix} \delta x \\ \delta y \\ \delta z \end{bmatrix}$$

Image of the sky  
using 2 antennas



$S(u, v)$

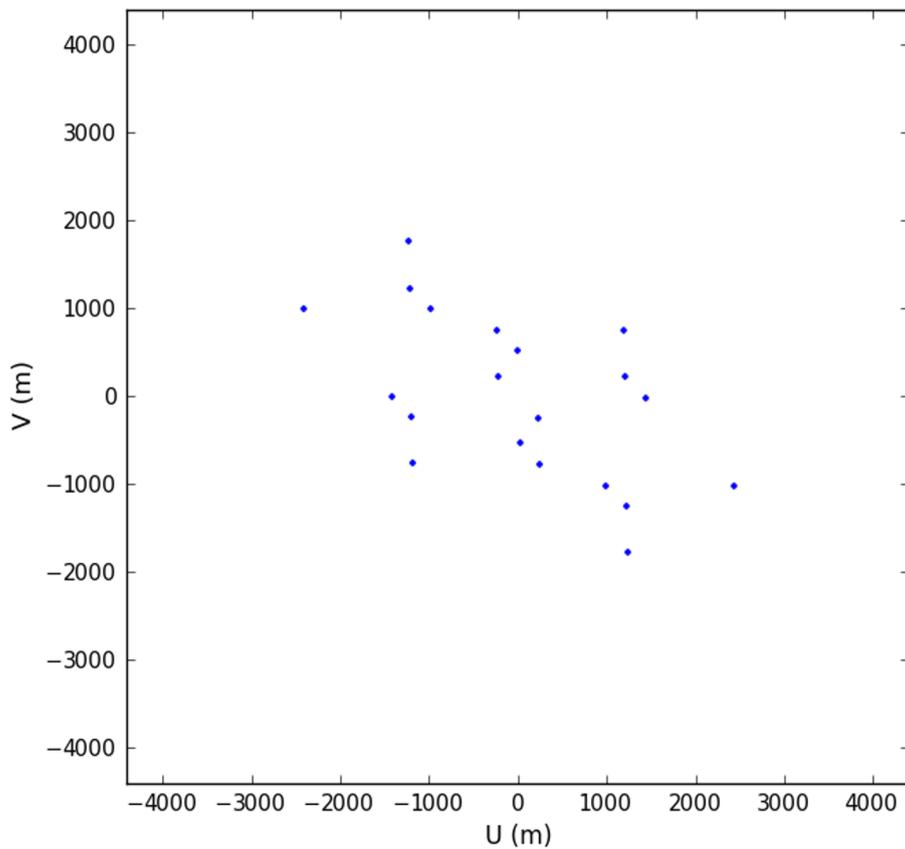
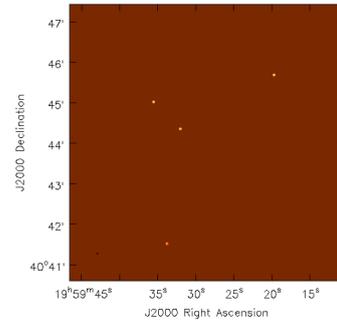


$I^{obs}(l, m)$

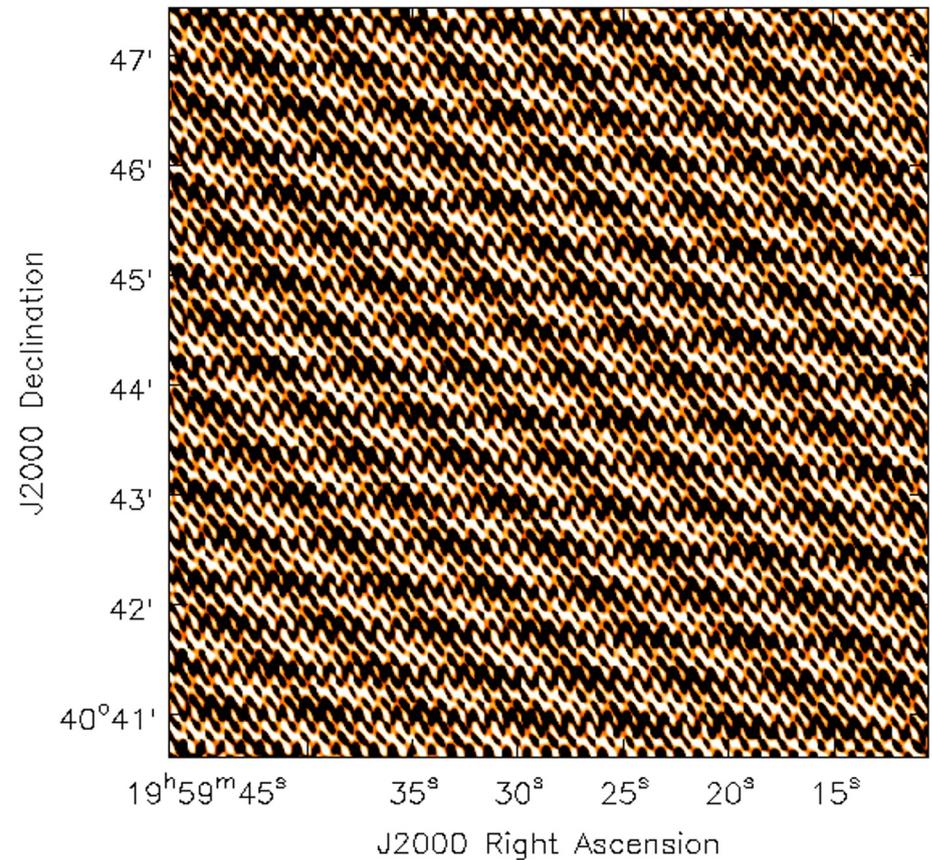
# Spatial Frequency (uv) coverage + Observed Image

$$\begin{bmatrix} u \\ v \\ w \end{bmatrix} = \frac{1}{\lambda} \begin{bmatrix} R(h, \theta) \end{bmatrix} \begin{bmatrix} \delta x \\ \delta y \\ \delta z \end{bmatrix}$$

Image of the sky  
using 5 antennas



$S(u, v)$

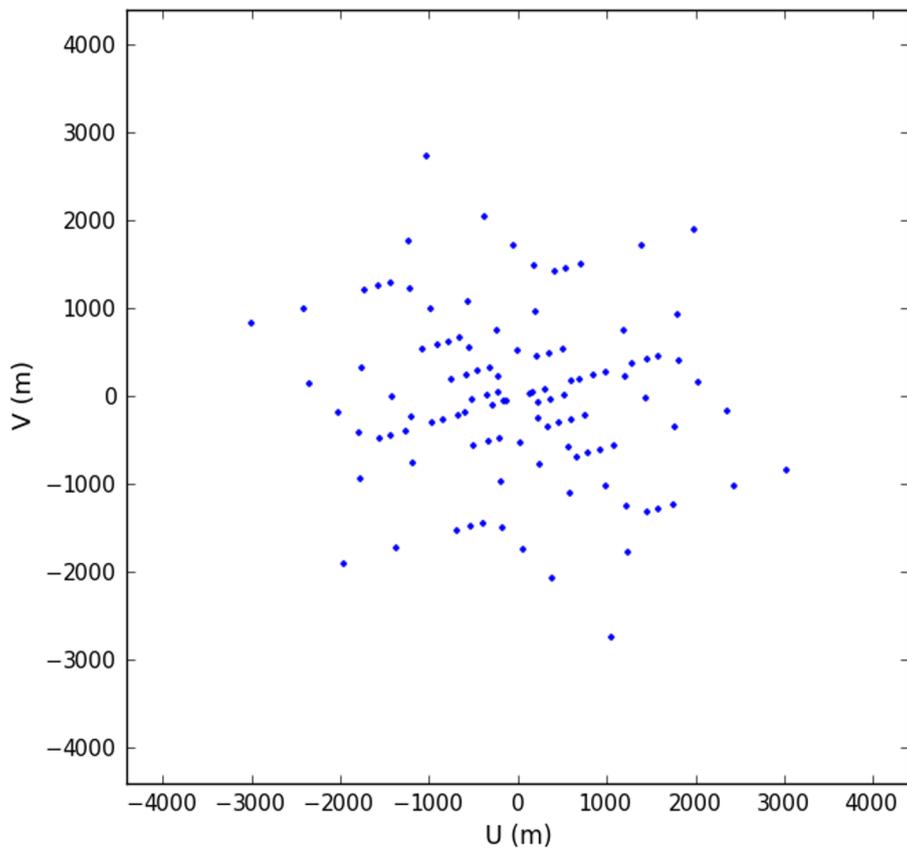
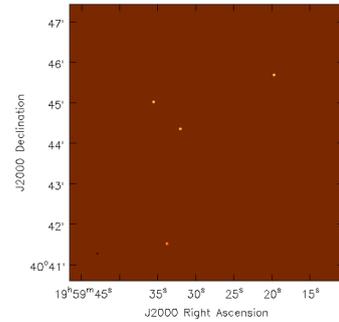


$I^{obs}(l, m)$

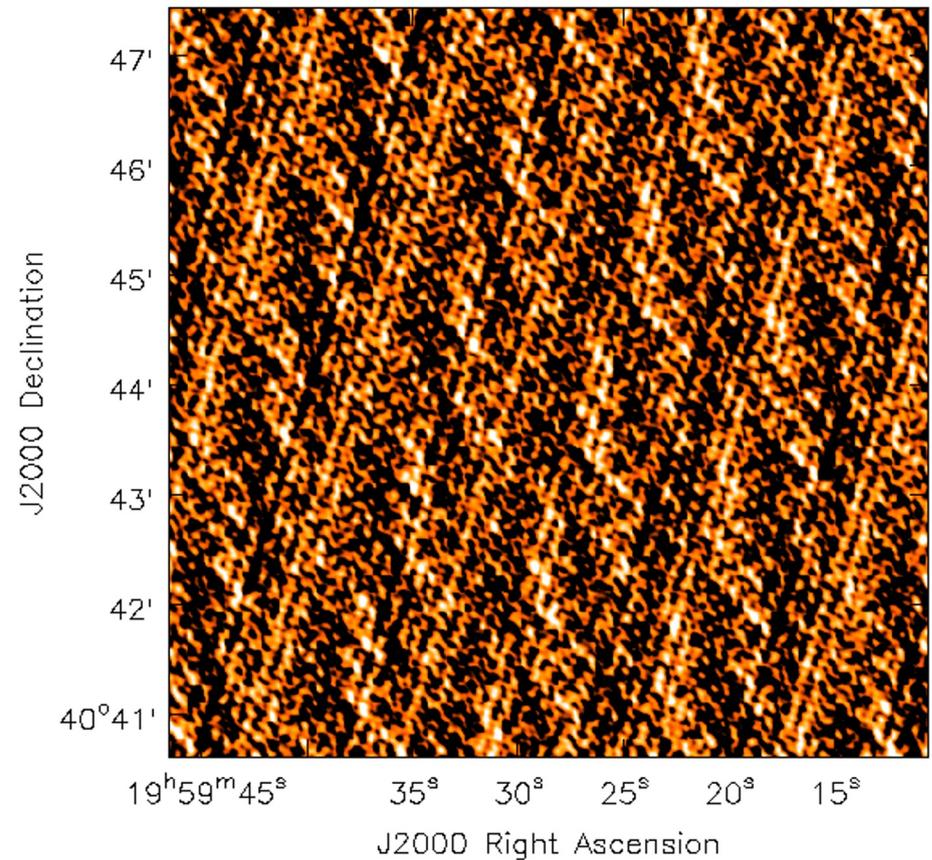
# Spatial Frequency (uv) coverage + Observed Image

$$\begin{bmatrix} u \\ v \\ w \end{bmatrix} = \frac{1}{\lambda} \begin{bmatrix} R(h, \theta) \end{bmatrix} \begin{bmatrix} \delta x \\ \delta y \\ \delta z \end{bmatrix}$$

Image of the sky  
using 11 antennas



$S(u, v)$

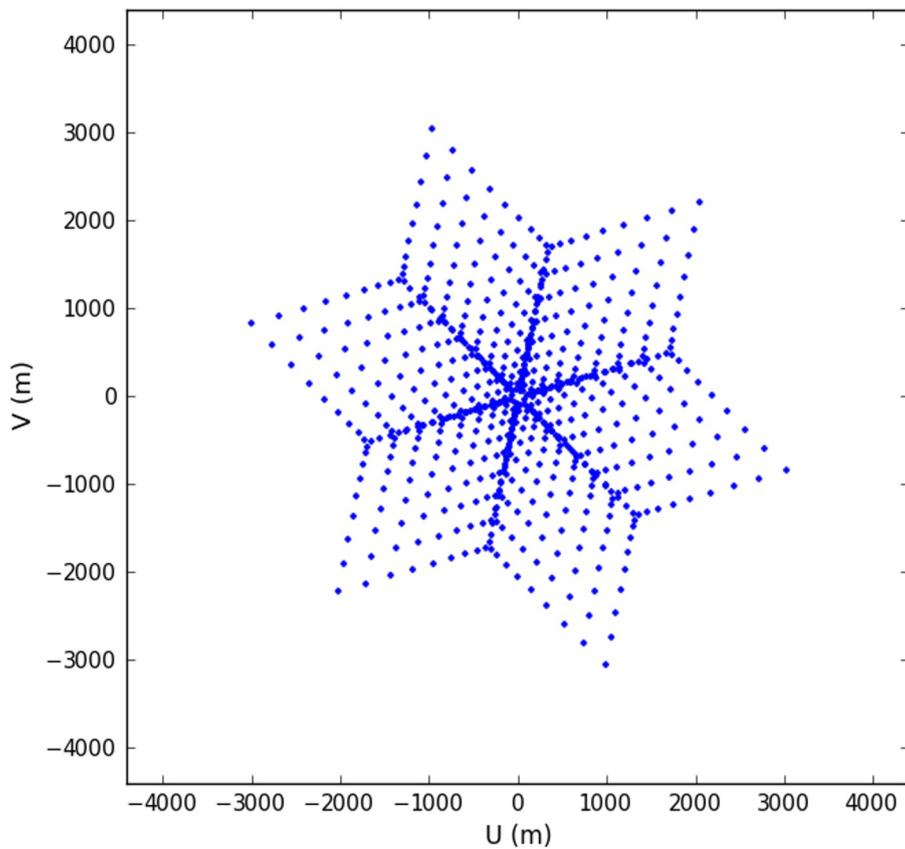
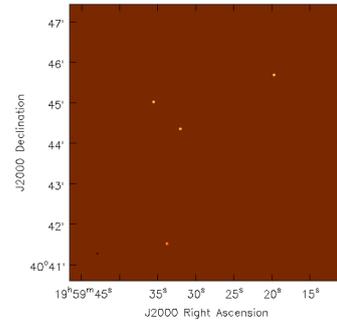


$I^{obs}(l, m)$

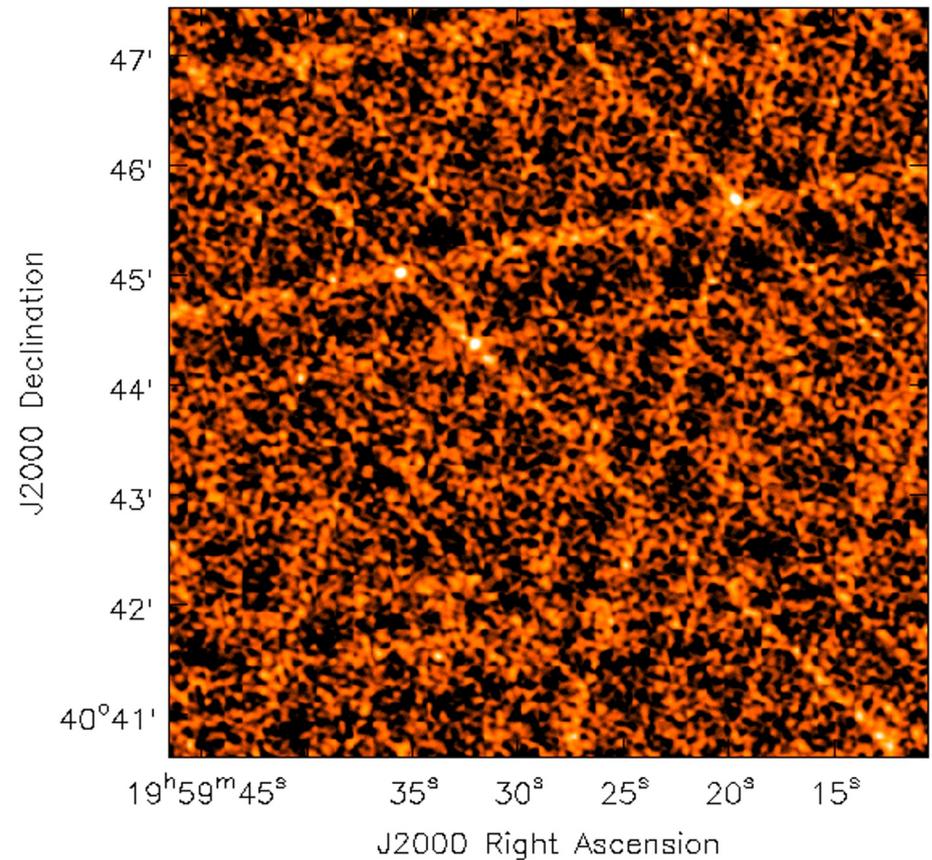
# Spatial Frequency (uv) coverage + Observed Image

$$\begin{bmatrix} u \\ v \\ w \end{bmatrix} = \frac{1}{\lambda} \begin{bmatrix} R(h, \theta) \end{bmatrix} \begin{bmatrix} \delta x \\ \delta y \\ \delta z \end{bmatrix}$$

Image of the sky  
using 27 antennas



$S(u, v)$

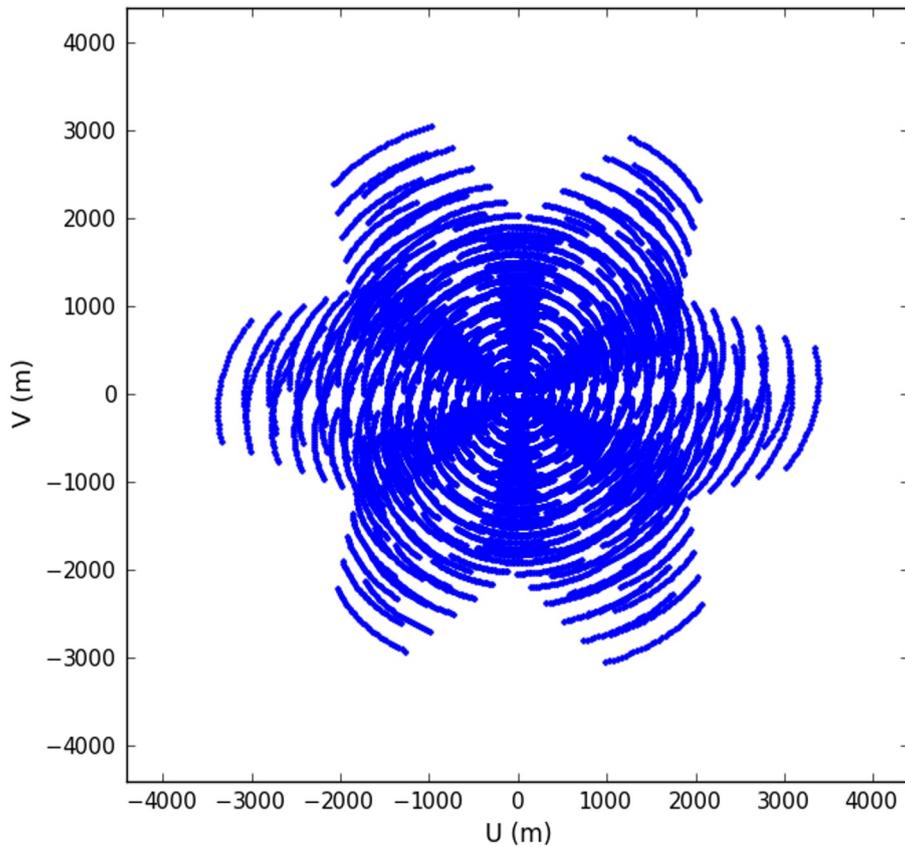
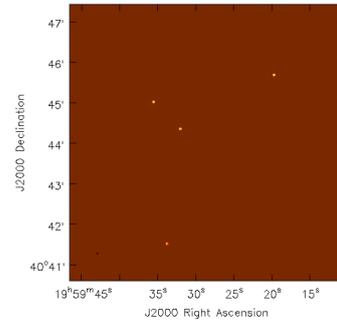


$I^{obs}(l, m)$

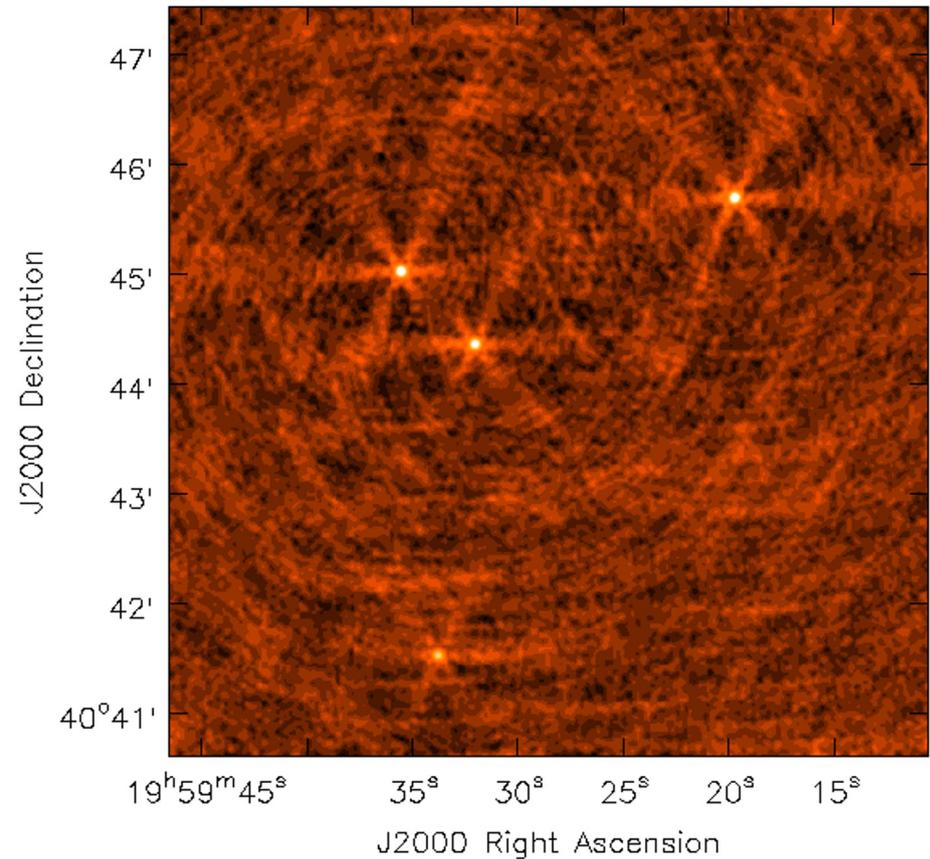
# Spatial Frequency (uv) coverage + Observed Image

$$\begin{bmatrix} u \\ v \\ w \end{bmatrix} = \frac{1}{\lambda} \begin{bmatrix} R(h, \theta) \end{bmatrix} \begin{bmatrix} \delta x \\ \delta y \\ \delta z \end{bmatrix}$$

Image of the sky  
using 27 antennas  
over 2 hours  
'Earth Rotation Synthesis'



$S(u, v)$



J2000 Right Ascension

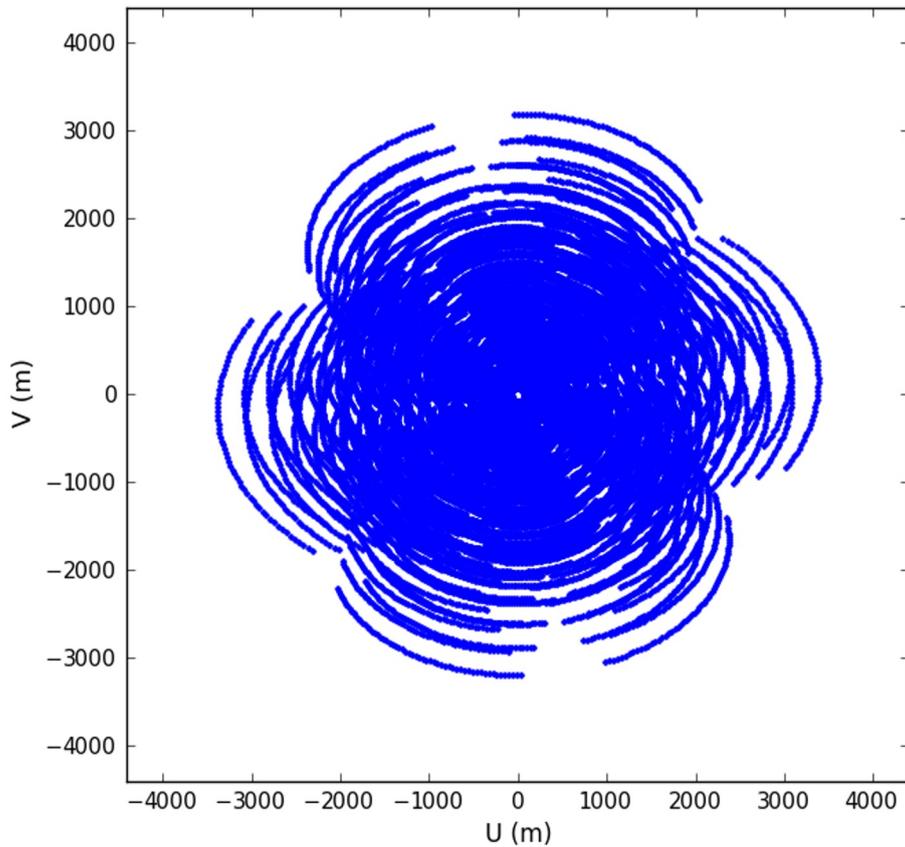
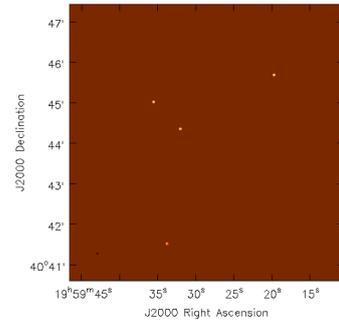
$I^{obs}(l, m)$

# Spatial Frequency (uv) coverage + Observed Image

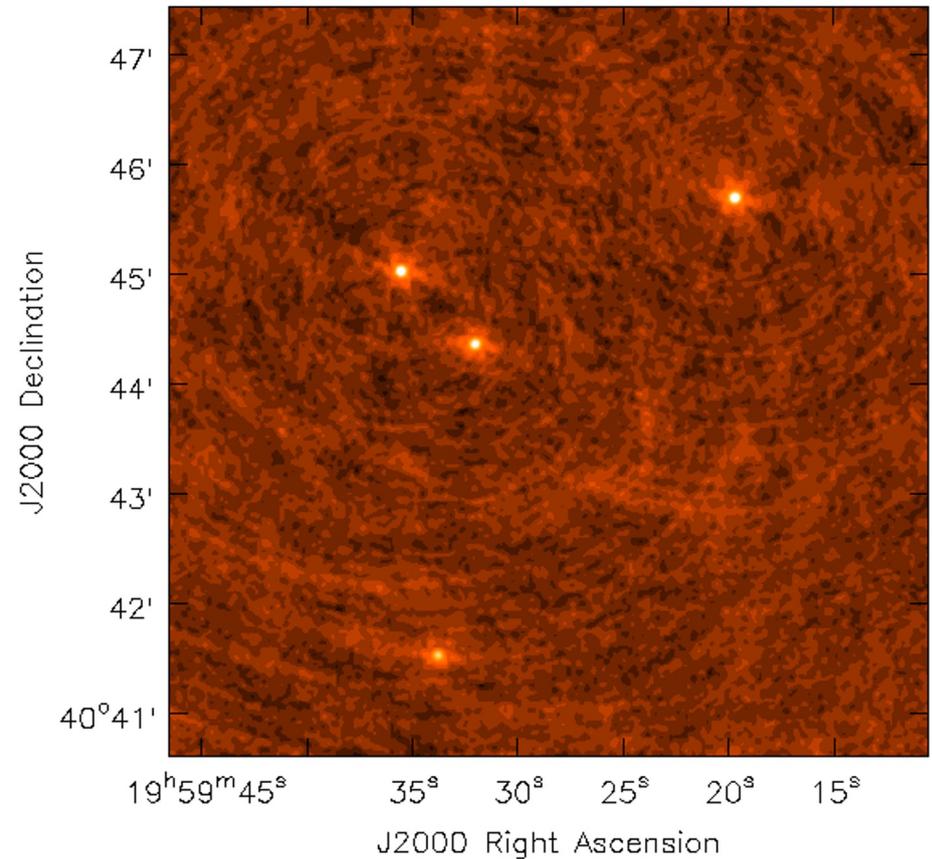
$$\begin{bmatrix} u \\ v \\ w \end{bmatrix} = \frac{1}{\lambda} \begin{bmatrix} R(h, \theta) \end{bmatrix} \begin{bmatrix} \delta x \\ \delta y \\ \delta z \end{bmatrix}$$

Image of the sky  
using 27 antennas  
over 4 hours

'Earth Rotation Synthesis'



$S(u, v)$

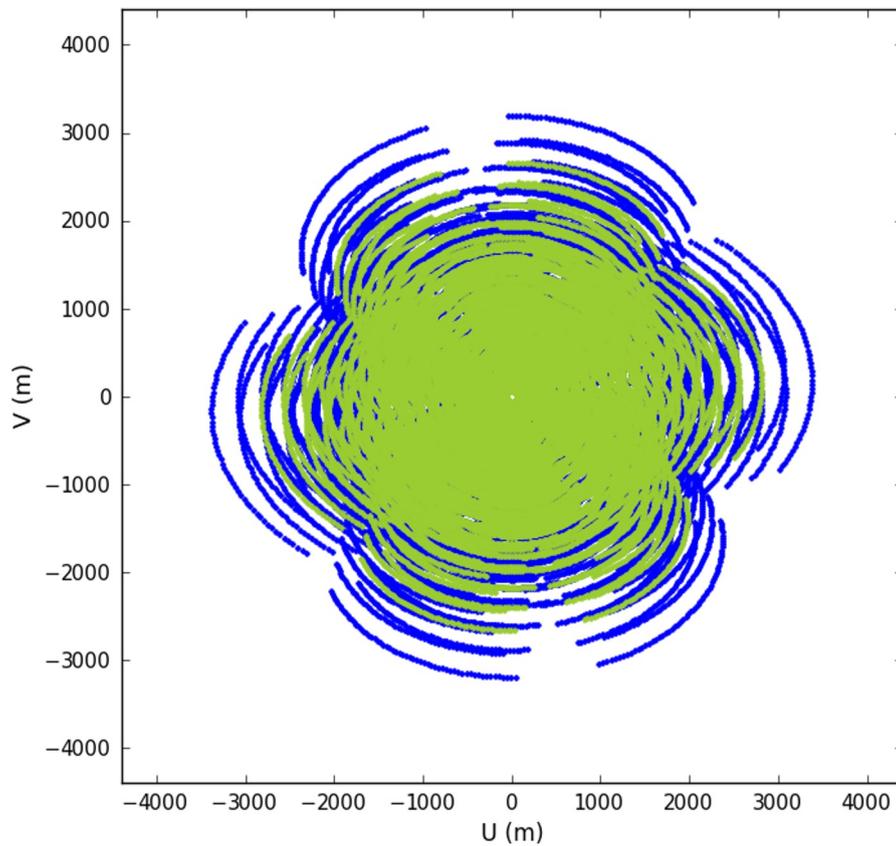
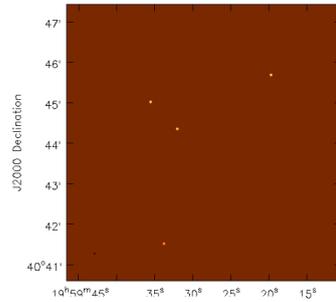


$I^{obs}(l, m)$

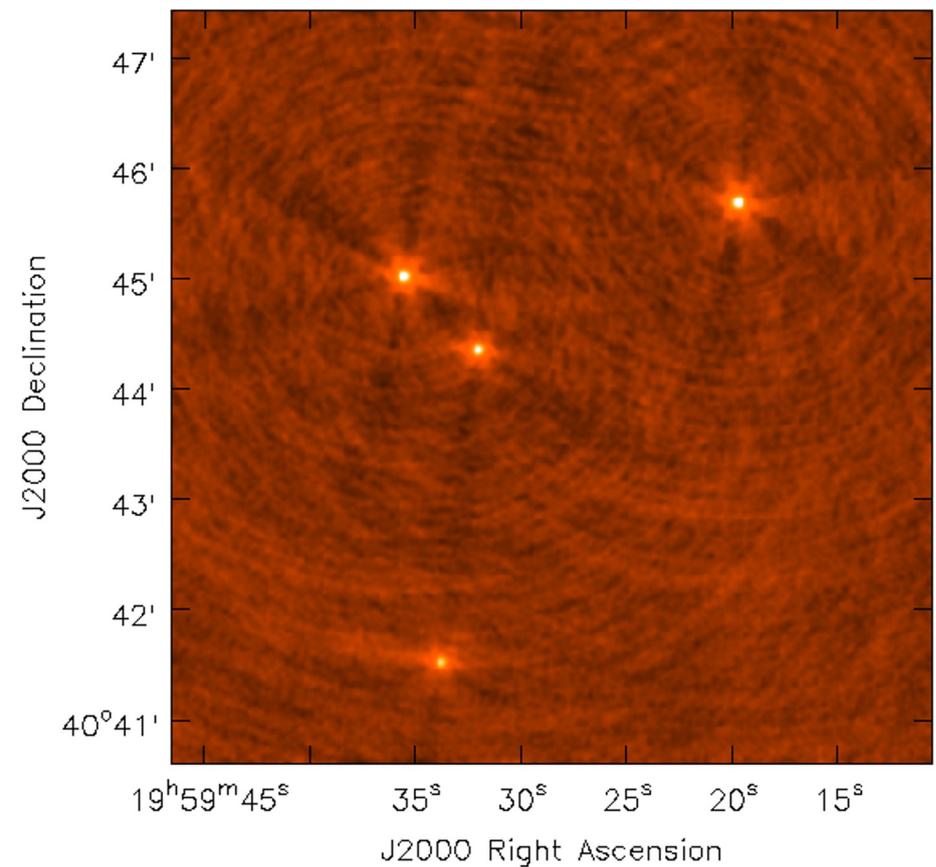
# Spatial Frequency (uv) coverage + Observed Image

$$\begin{bmatrix} u \\ v \\ w \end{bmatrix} = \frac{1}{\lambda} \begin{bmatrix} R(h, \theta) \end{bmatrix} \begin{bmatrix} \delta x \\ \delta y \\ \delta z \end{bmatrix}$$

Image of the sky  
using 27 antennas  
over 4 hours, 2 freqs  
'Multi-Frequency Synthesis'



$S(u, v)$

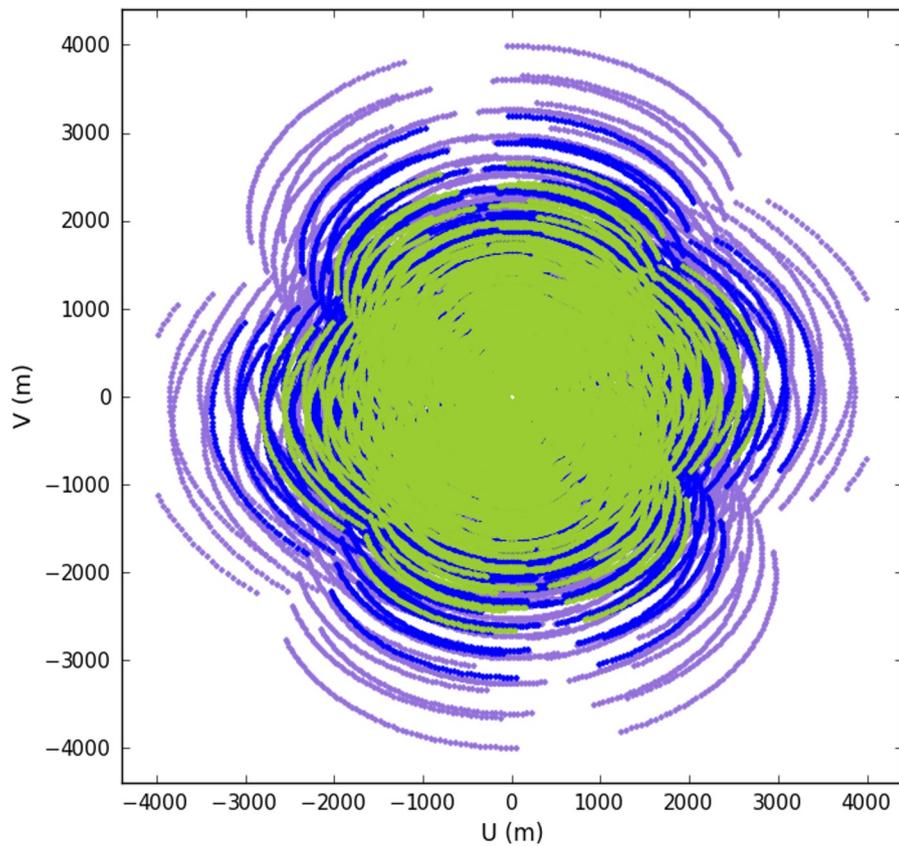
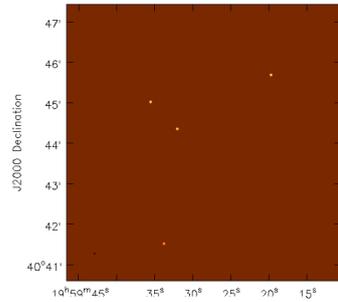


$I^{obs}(l, m)$

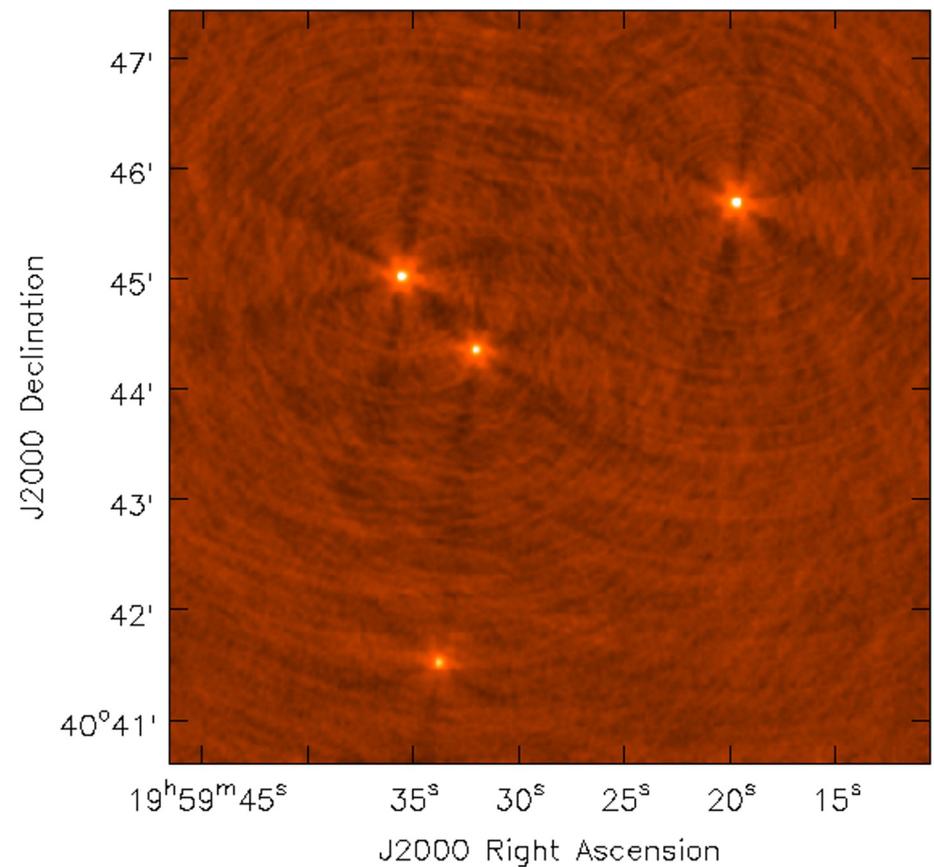
# Spatial Frequency (uv) coverage + Observed Image

$$\begin{bmatrix} u \\ v \\ w \end{bmatrix} = \frac{1}{\lambda} \begin{bmatrix} R(h, \theta) \end{bmatrix} \begin{bmatrix} \delta x \\ \delta y \\ \delta z \end{bmatrix}$$

Image of the sky  
using 27 antennas  
over 4 hours, 3 freqs  
'Multi-Frequency Synthesis'



$S(u, v)$



J2000 Right Ascension

$I^{obs}(l, m)$

---

# Image Reconstruction

# Imaging with modern instruments

---

## Basic Imaging :

Narrow-frequency range, Small region of the sky

=> The 2D Fourier Transform relations hold

=> Convolution and deconvolution

## Wide-Band Imaging :

=> Sky and instrument change across frequency range

## Wide-Field Imaging

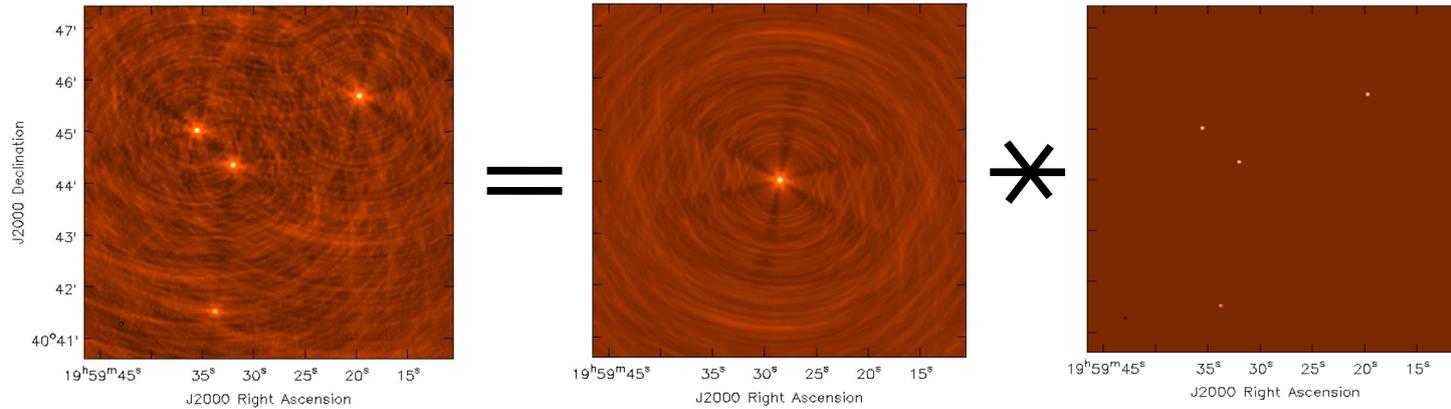
=> The 2D Fourier Transform relation breaks

## Mosaic Imaging

=> Image an area larger than what each antenna can see.

# Image formed by an interferometer : Convolution Equation

$$I^{obs}(l, m) = I^{PSF}(l, m) * I^{sky}(l, m)$$

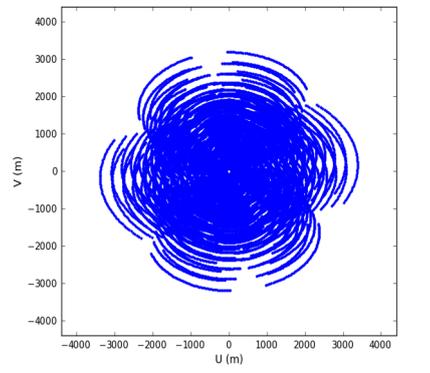


You have measured the  
Convolution of the True Sky  
with the instrumental PSF.



PSF = Point Spread Function

Inverse Fourier transform  
of the UV-coverage



$S(u, v)$

Recovering True Sky = DE-convolution

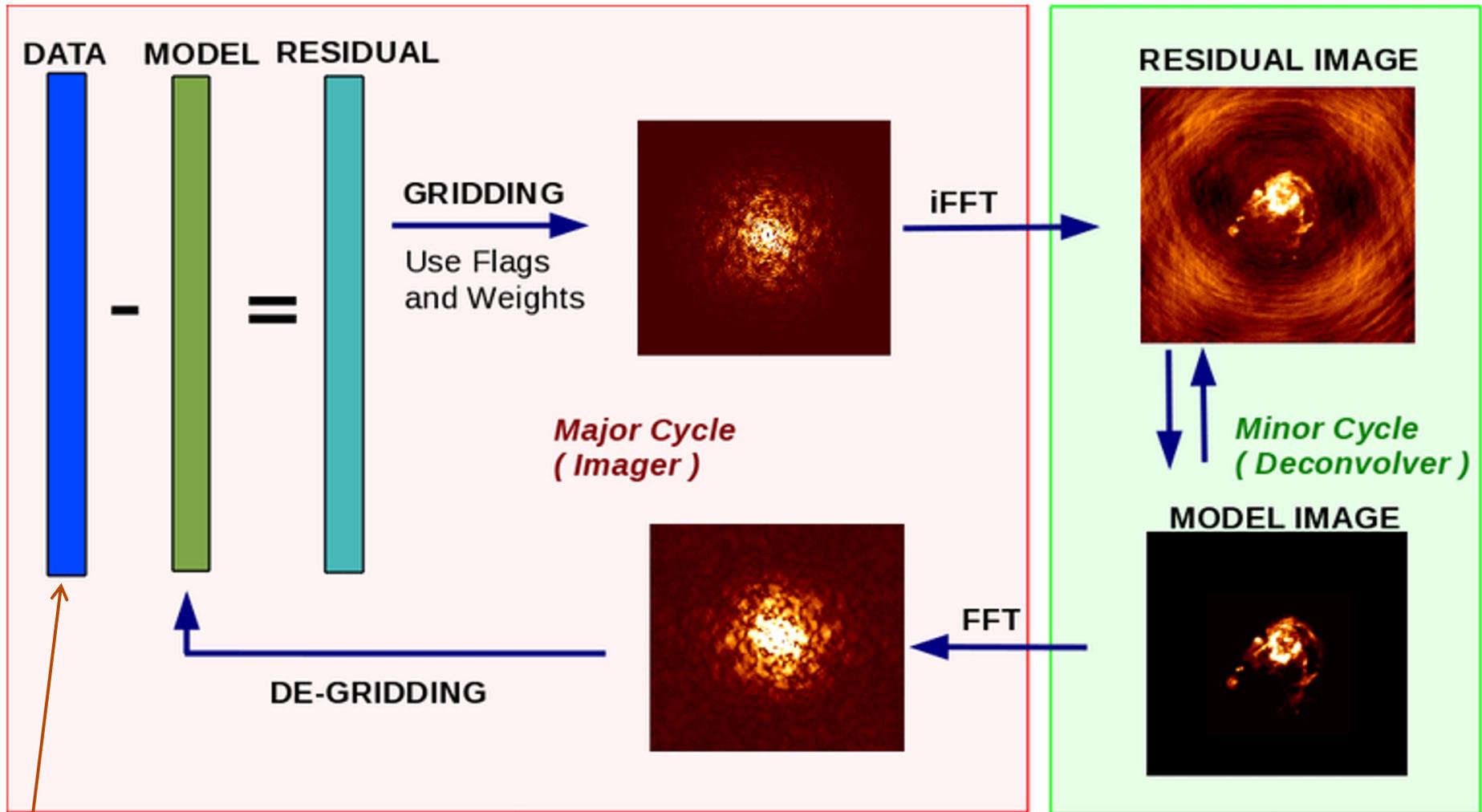
” Model Fitting “

- Parameterize the sky structure
- Iteratively build a “model” of the structure by minimizing Chi-square

# Reconstruction = Imaging + Deconvolution

Data = Incomplete set of samples of the true signal

Image Reconstruction = Fit a model (of the sky) to the data



$$\langle E_i E_j^* \rangle, \vec{u}, \vec{v}$$

# Deconvolution – Hogbom CLEAN

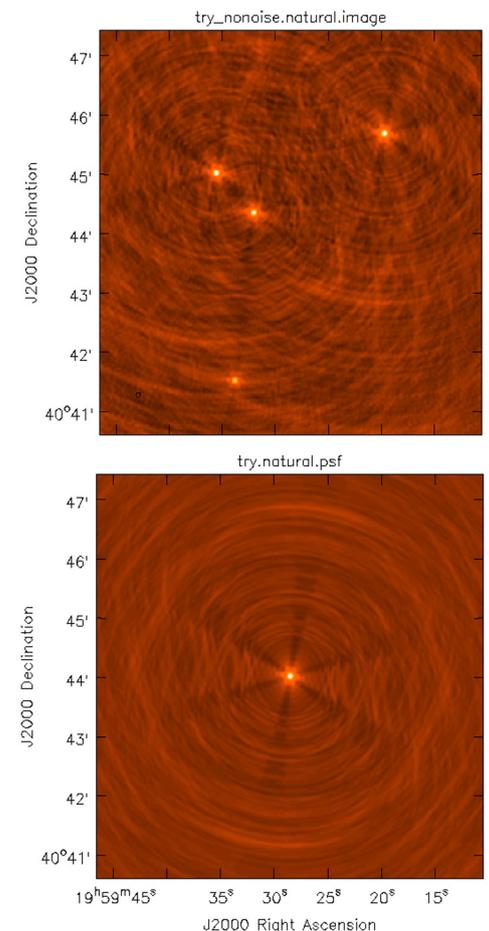
Sky Model : List of delta-functions

- (1) Construct the observed (dirty) image and PSF
- (2) Search for the location of peak amplitude.
- (3) Add a delta-function of this peak/location to the model

(4) Subtract the contribution of this component from the dirty image - a scaled/shifted copy of the PSF

Repeat steps (2), (3), (4) until a stopping criterion is reached.

(5) Restore : Smooth the model with a 'clean beam' and add residuals



The CLEAN algorithm can be formally derived as a model-fitting problem

- model parameters : locations and amplitudes of delta functions
- solution process :  $\chi^2$  minimization via an iterative steepest-descent algorithm ( method of successive approximation )

# Deconvolution – Comparison of Algorithms

CLEAN

MEM

MS-CLEAN

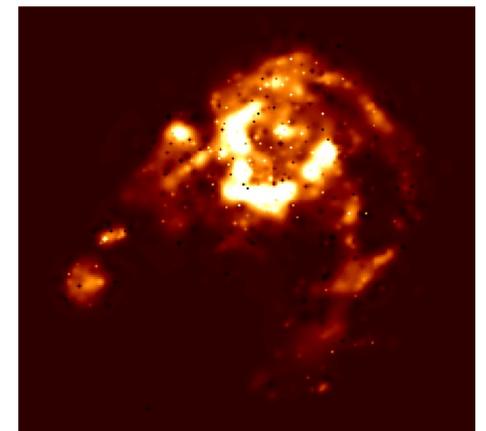
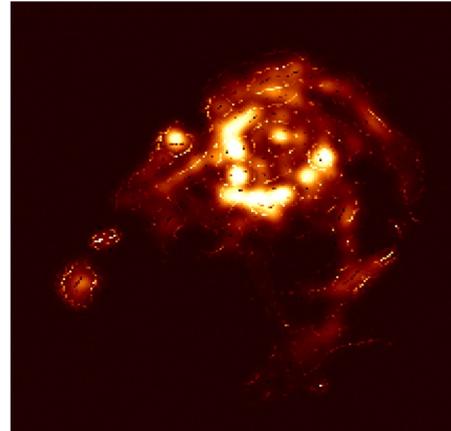
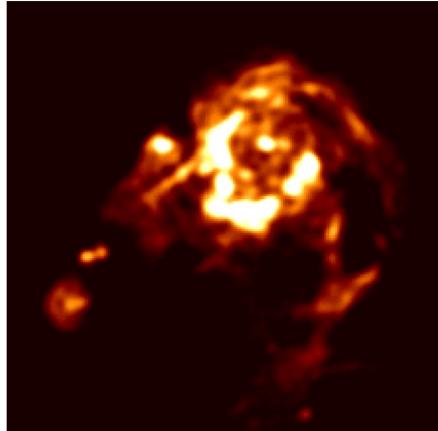
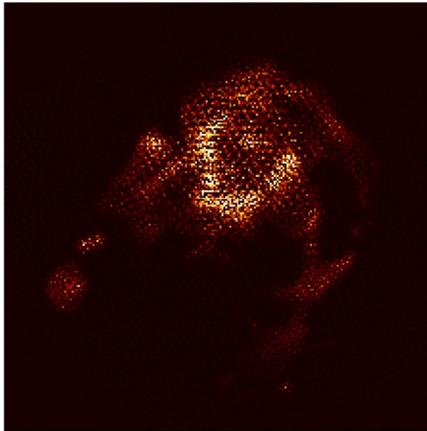
ASP

Point source model

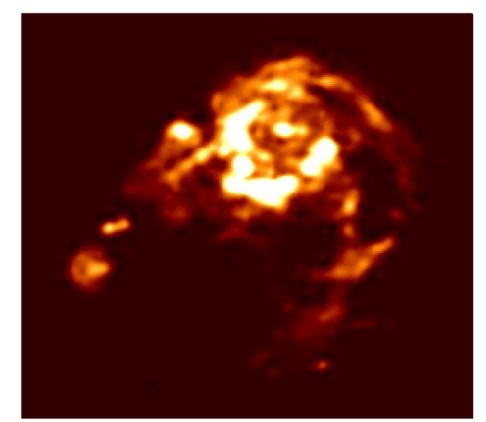
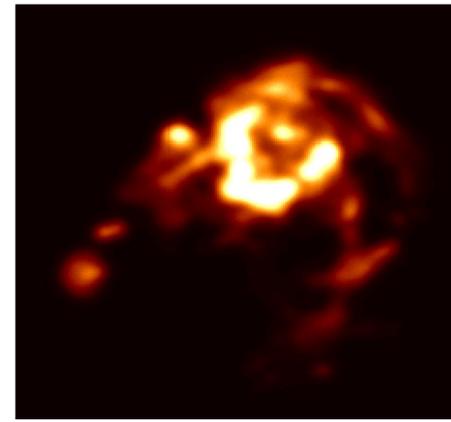
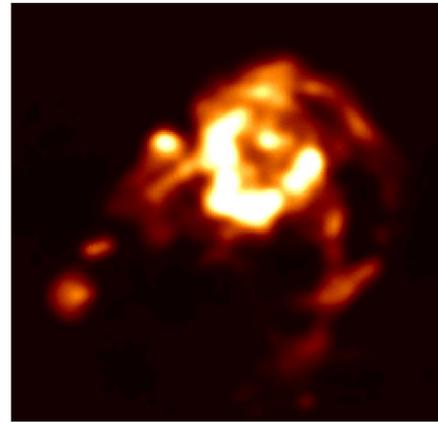
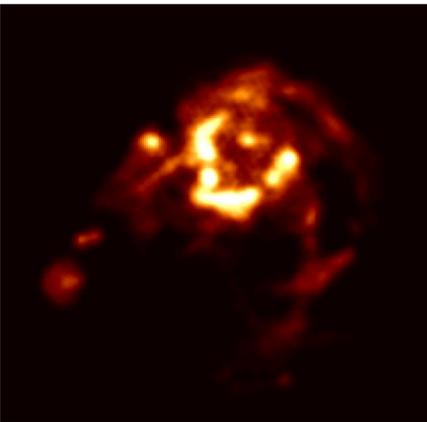
Point source model  
with a smoothness  
constraint

Multi-Scale model  
with a fixed set of  
scale sizes

Multi-Scale model  
with adaptive best-fit  
scale per component



$I^m$

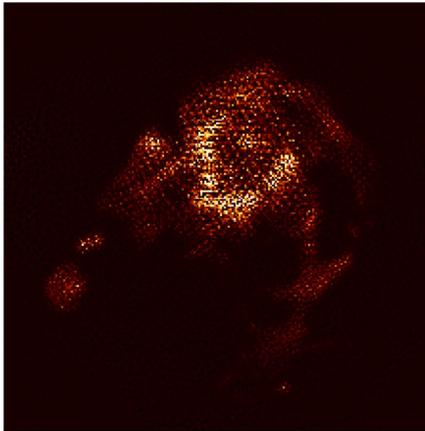


$I^{out}$

# Deconvolution – Comparison of Algorithms

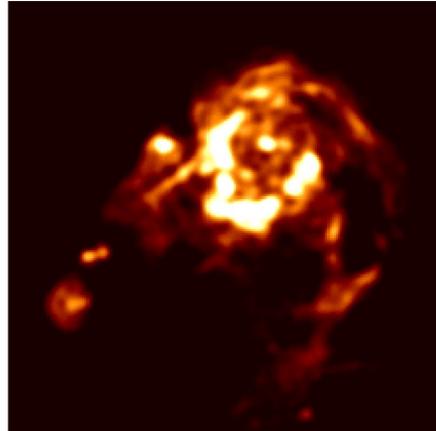
CLEAN

Point source model



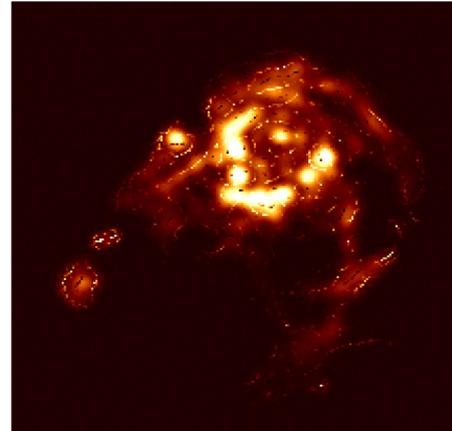
MEM

Point source model  
with a smoothness  
constraint



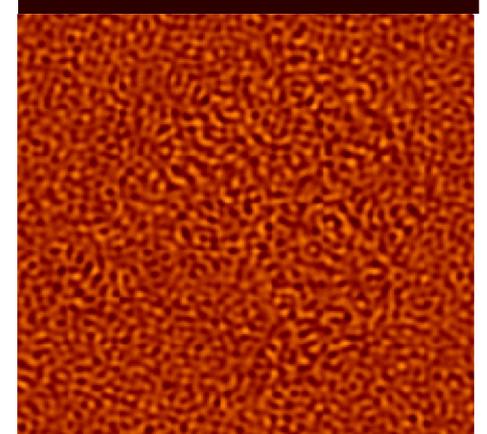
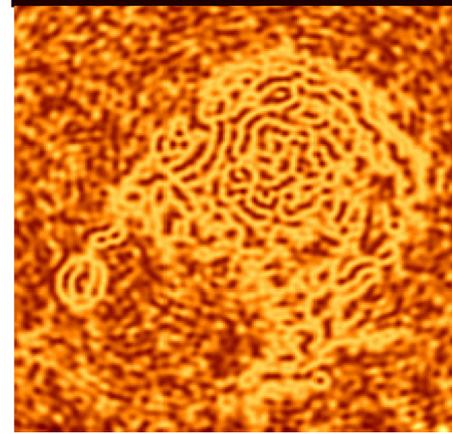
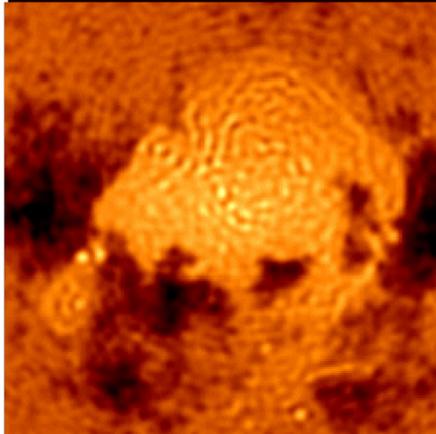
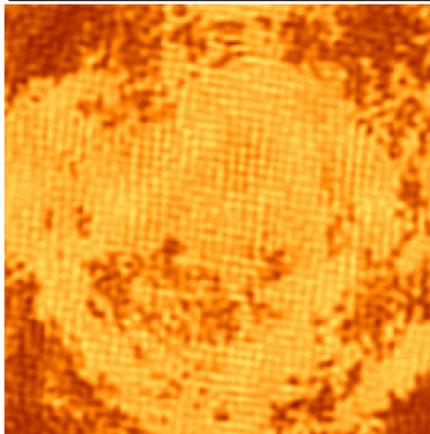
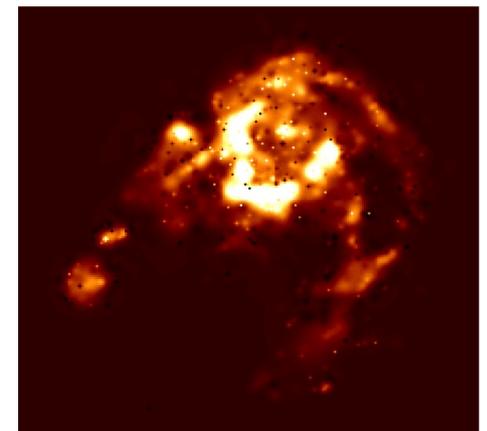
MS-CLEAN

Multi-Scale model  
with a fixed set of  
scale sizes



ASP

Multi-Scale model  
with adaptive best-fit  
scale per component



$I^m$

$I^{res}$

# Imaging with modern instruments

---

## Basic Imaging :

Narrow-frequency range, Small region of the sky

=> The 2D Fourier Transform relations hold

=> Convolution and deconvolution

## Wide-Band Imaging :

=> Sky and instrument change across frequency range

## Wide-Field Imaging

=> The 2D Fourier Transform relation breaks

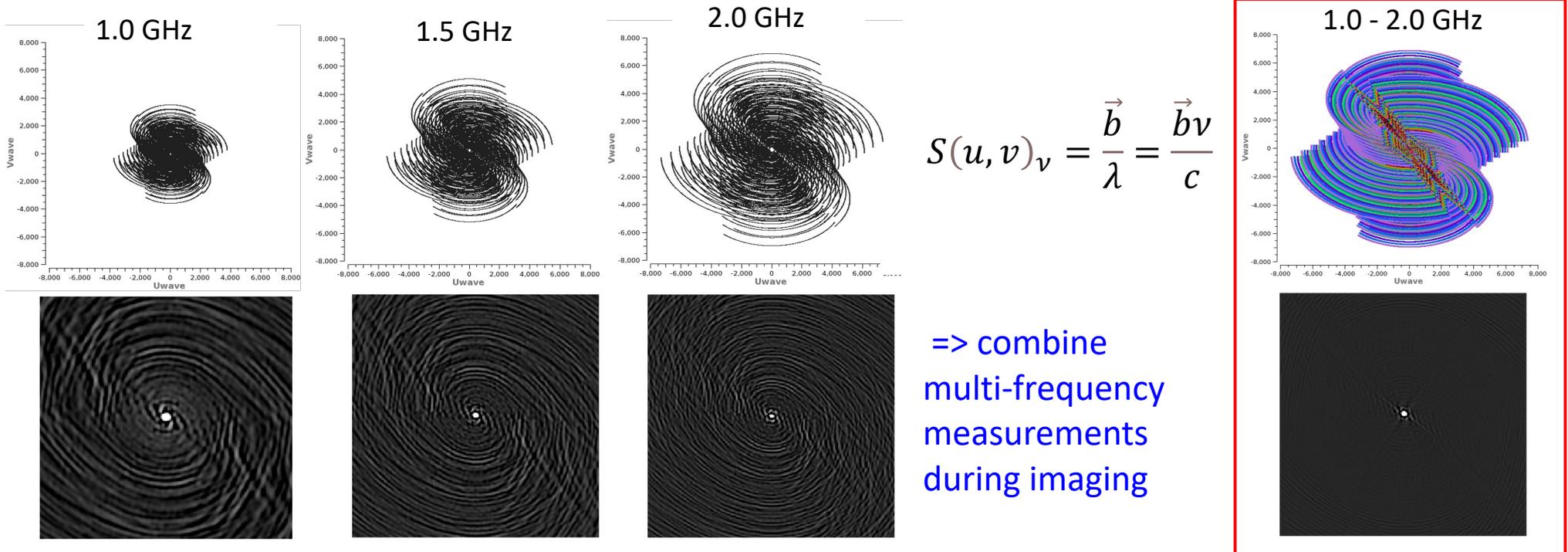
## Mosaic Imaging

=> Image an area larger than what each antenna can see.

# Wide-band Imaging – Sensitivity and Multi-Frequency Synthesis

Frequency Range :	(1 – 2 GHz)	(4 – 8 GHz)	(8 – 12 GHz)
Bandwidth : $\nu_{max} - \nu_{min}$	1 GHz	4 GHz	4 GHz
Bandwidth Ratio : $\nu_{max} : \nu_{min}$	2 : 1	2 : 1	1.5 : 1
Fractional Bandwidth : $(\nu_{max} - \nu_{min}) / \nu_{mid}$	66%	66%	40%

UV-coverage / imaging properties change with frequency

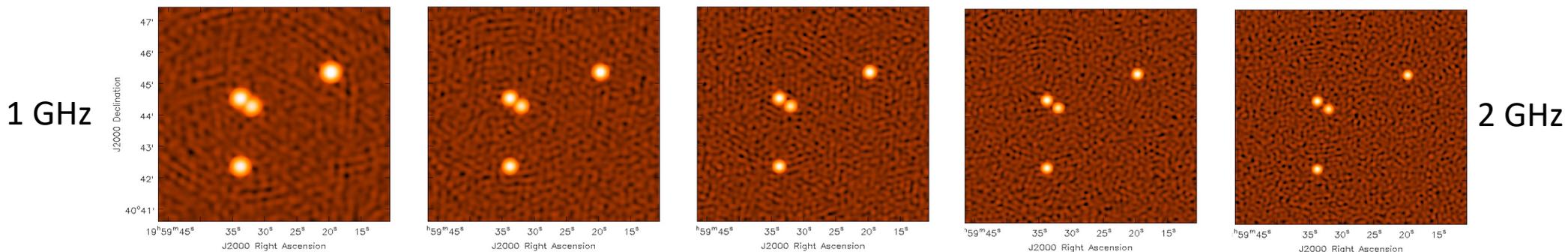


Sky Brightness can also change with frequency → model intensity and spectrum

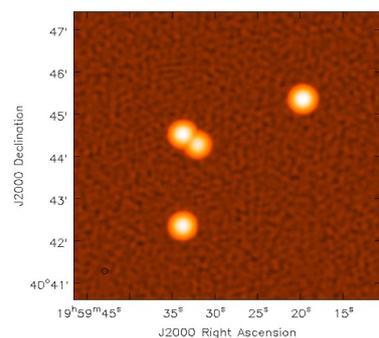
# Spectral Cube (vs) MFS imaging

3 flat-spectrum sources + 1 steep-spectrum source ( 1-2 GHz VLA observation )

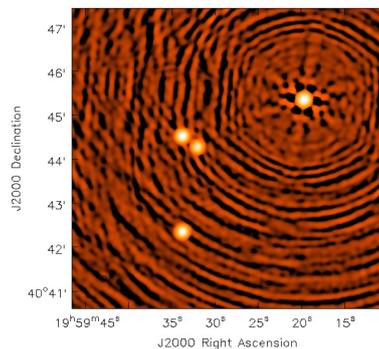
Images made at different frequencies ( limited to narrow-band sensitivity )



Add all single-frequency images (after smoothing to a low resolution)

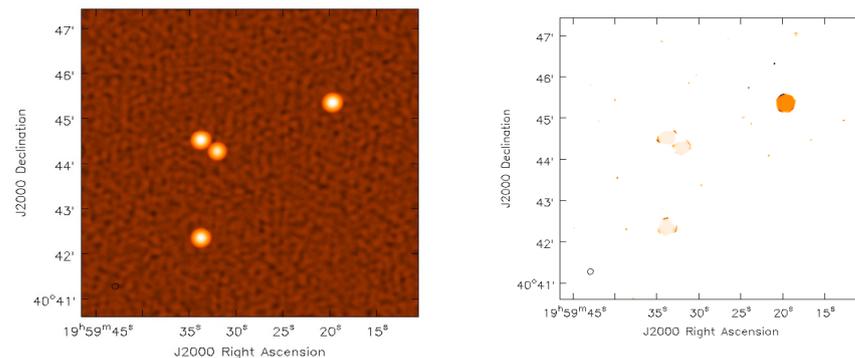


Use wideband UV-coverage, but ignore spectrum ( MFS, nterms=1)



Use wideband UV-coverage + Model and fit for spectra too ( MT-MFS, nterms > 1 )

Output : Intensity and Spectral-Index



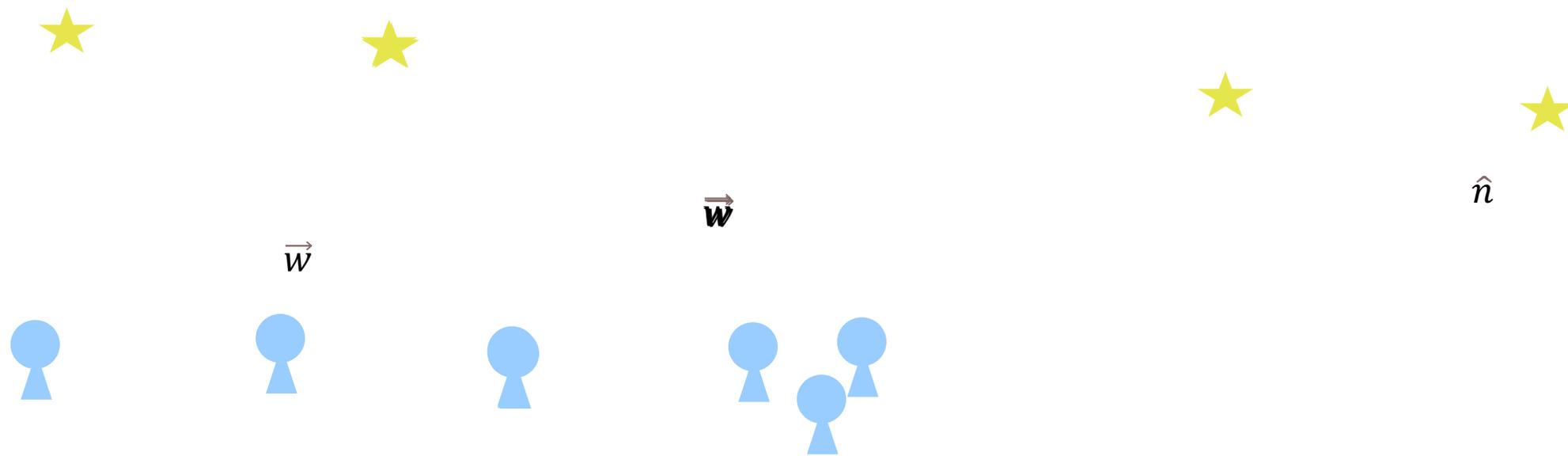
# Wide-Field Imaging – W-term

$$V^{obs}(u, v) = S(u, v) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

$$V^{obs}(u, v) = S(u, v) \iiint I(l, m) e^{2\pi i(ul+vm+w(n-1))} dl dm dn$$

The ' w ' of a baseline can be large, away from the image phase center

The ' n ' for a source can be large, away from the image phase center



There are algorithms to account for this : Image Faceting, W-Projection.

# Wide-Field Imaging – W-term

$$V^{obs}(u, v) = S(u, v) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

$$V^{obs}(u, v) = S(u, v) \iiint I(l, m) e^{2\pi i(ul+vm+w(n-1))} dl dm dn$$

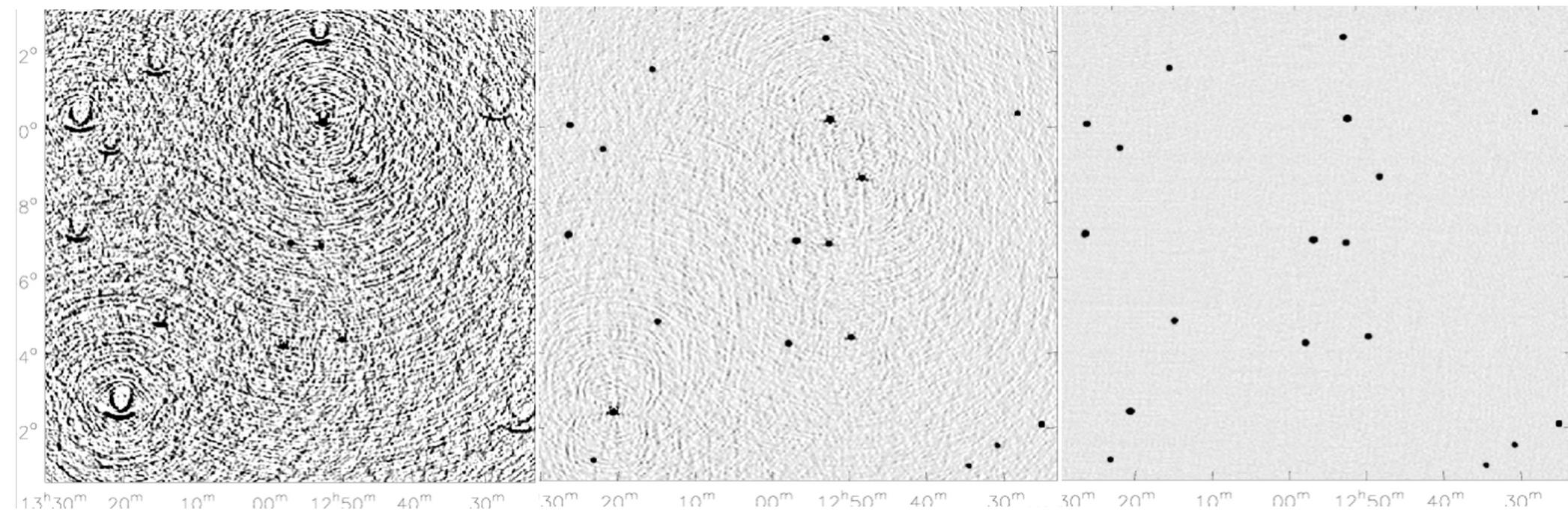
The ' w ' of a baseline can be large, away from the image phase center

The ' n ' for a source can be large, away from the image phase center

2D Imaging

Facet Imaging

W-Projection

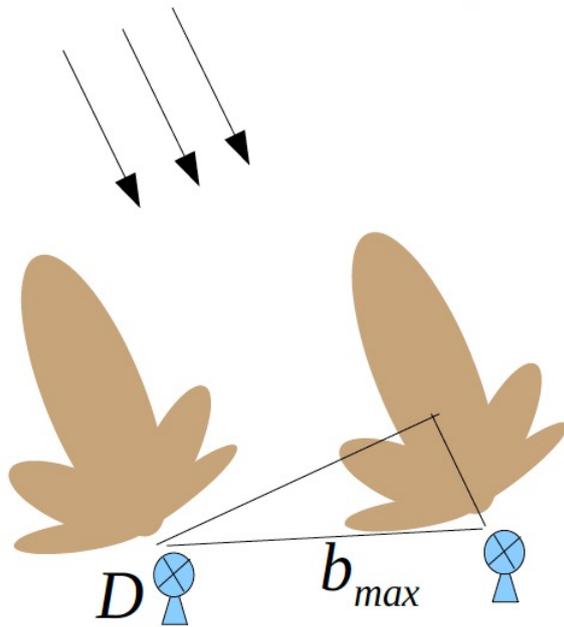


# Wide-Field Imaging – Primary Beams

Each antenna has a limited field of view => Primary Beam (gain) pattern

=> Sky is (approx) multiplied by PB, before being sampled by the interferometer

$$I^{obs}(l, m) \approx I^{PSF}(l, m) * [P^{sky}(l, m) \cdot I^{sky}(l, m)]$$



The antenna field of view :

$D$  = antenna diameter

$$\lambda/D$$

Compare with angular resolution of the interferometer :

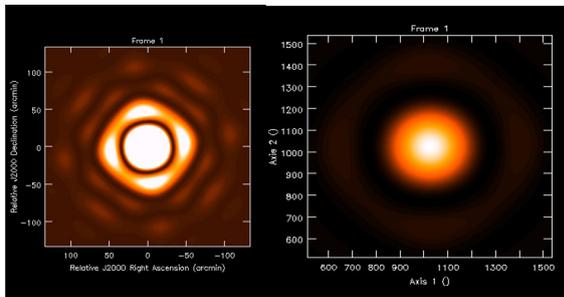
$$\lambda/b_{max}$$



But, in reality,  $P$  changes with time, freq, pol and antenna....

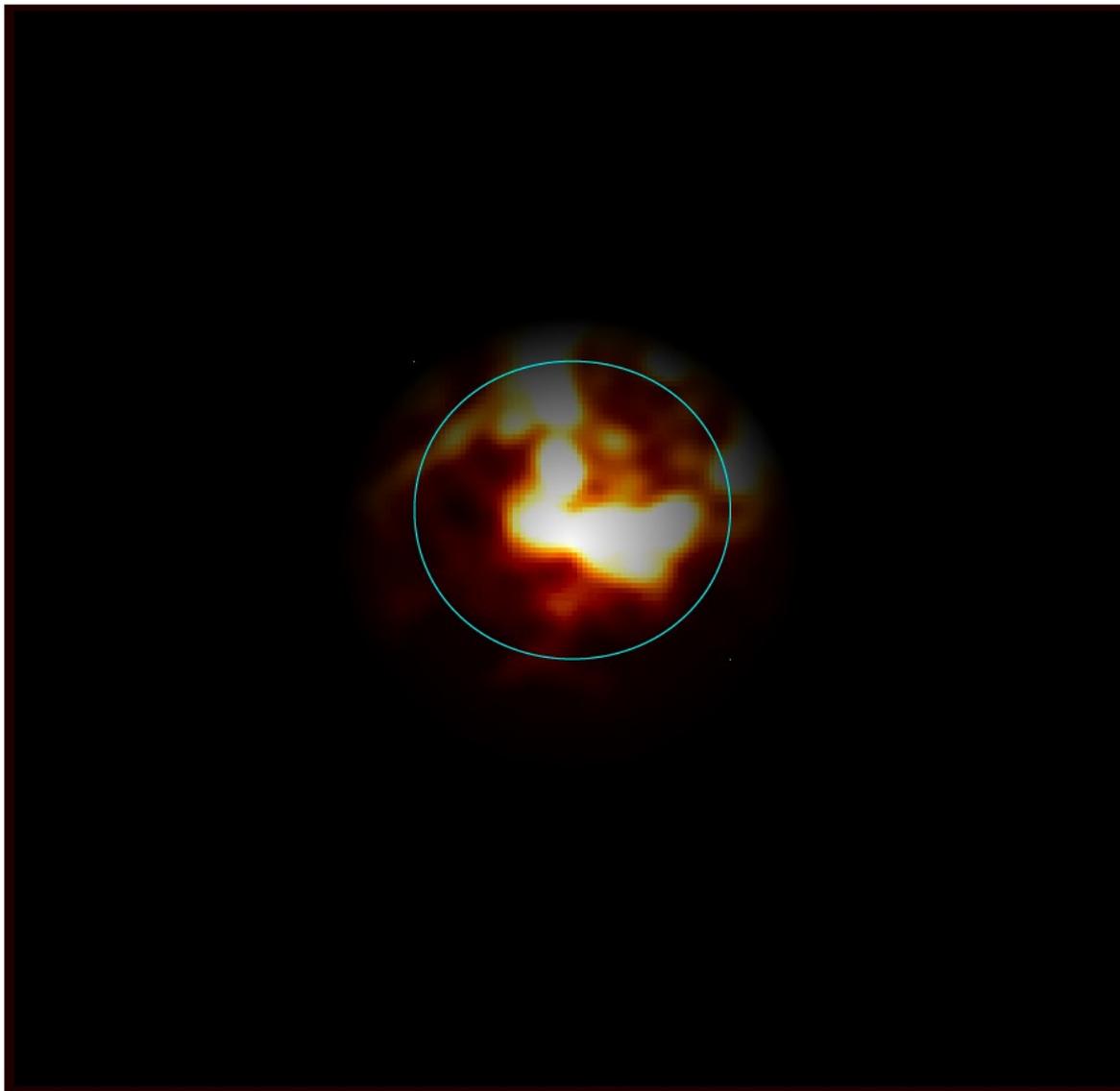
=> Ignoring such effects limits dynamic range to  $10^4$

=> More-accurate method to account for this : A-Projection



# Wide-field Imaging -- Mosaics

Combine data from multiple pointings to form one large image.



One Pointing sees only part of the source

Combine pointings either before or after deconvolution.

## Stitched mosaic :

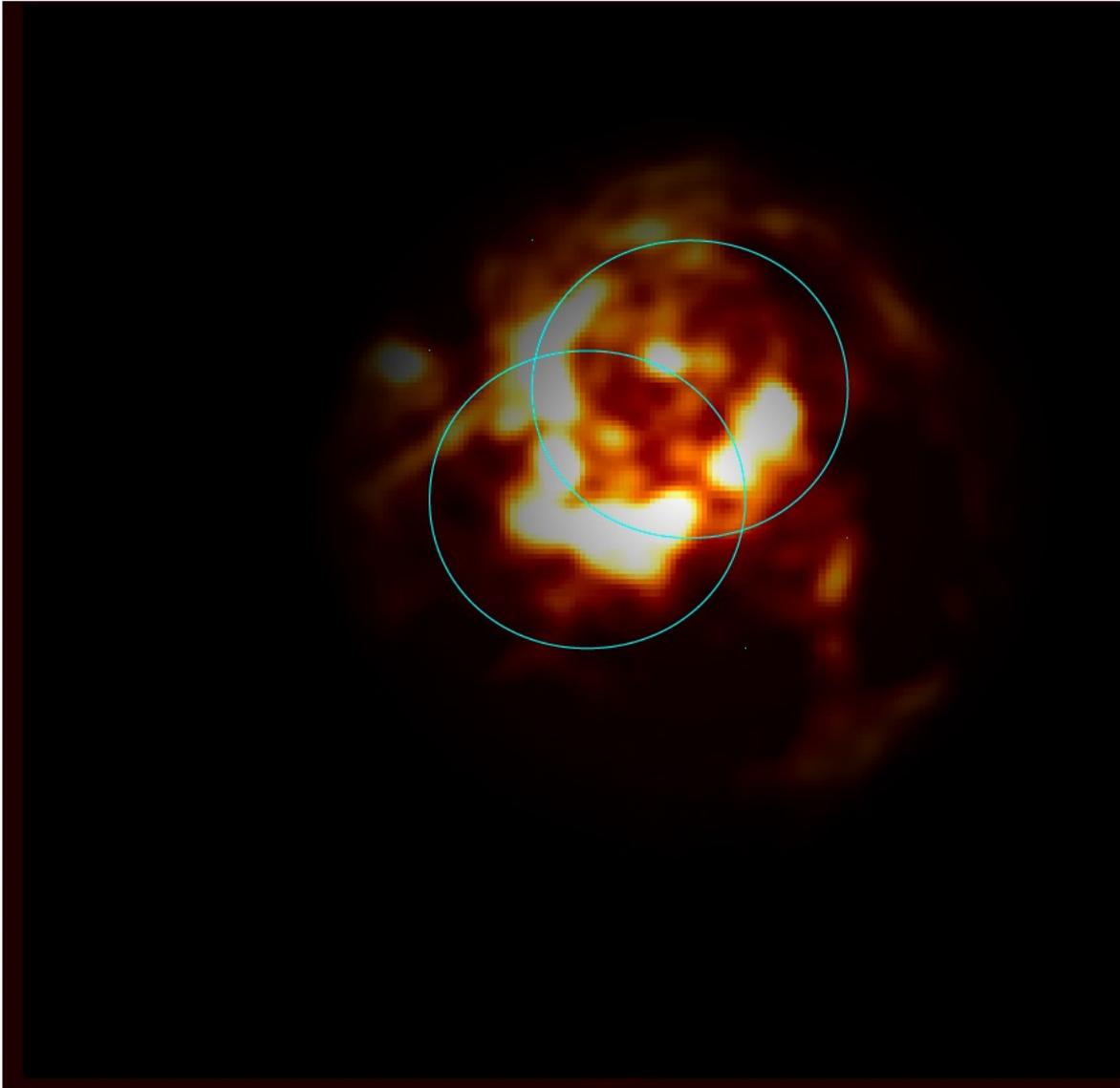
- Deconvolve each pointing separately
- Divide each image by PB
- Combine as a weighted avg

## Joint mosaic :

- Combine observed images as a weighted average
- (or)
- Grid all data onto one UV-grid, and then iFFT
- Deconvolve as one large image

# Wide-field Imaging -- Mosaics

Combine data from multiple pointings to form one large image.



Two Pointings see more.....

Combine pointings either before or after deconvolution.

## Stitched mosaic :

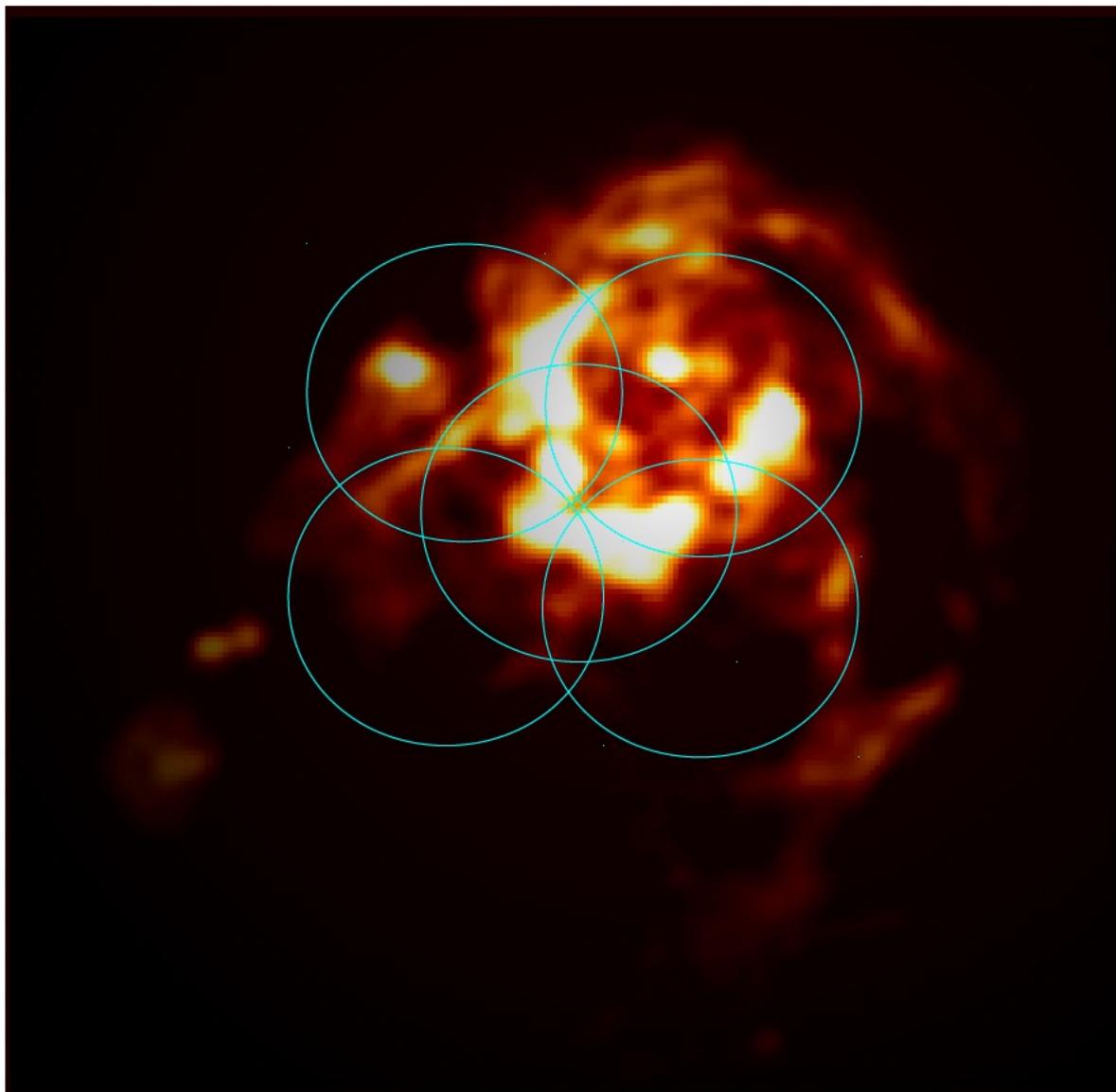
- Deconvolve each pointing separately
- Divide each image by PB
- Combine as a weighted avg

## Joint mosaic :

- Combine observed images as a weighted average  
(or)  
Grid all data onto one UV-grid,  
and then iFFT
- Deconvolve as one large image

# Wide-field Imaging -- Mosaics

Combine data from multiple pointings to form one large image.



Combine pointings either before or after deconvolution.

## Stitched mosaic :

- Deconvolve each pointing separately
- Divide each image by PB
- Combine as a weighted avg

## Joint mosaic :

- Combine observed images as a weighted average
- (or)
- Grid all data onto one UV-grid, and then iFFT
- Deconvolve as one large image

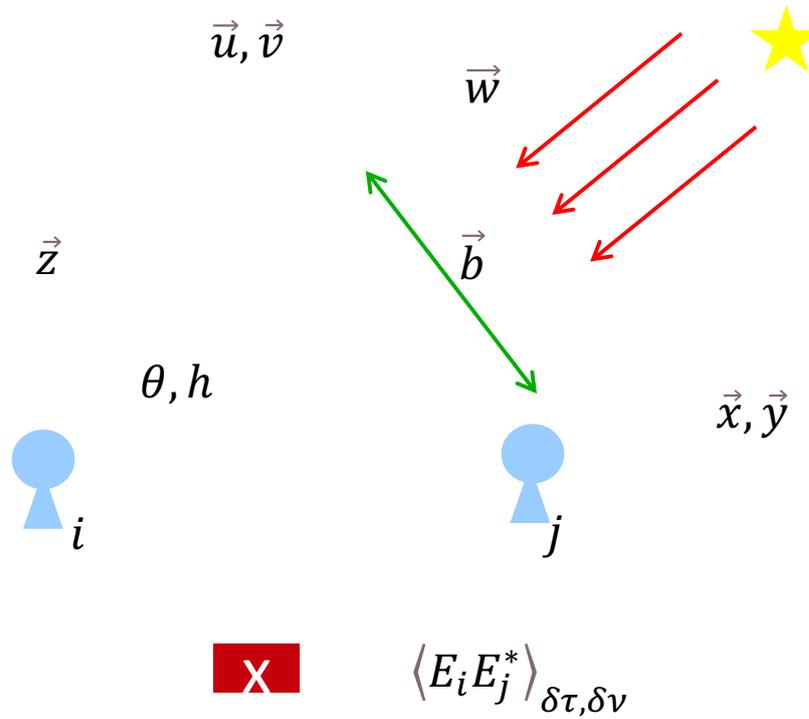
Use many pointings to cover the source with approximately uniform sensitivity

---

# Data Analysis

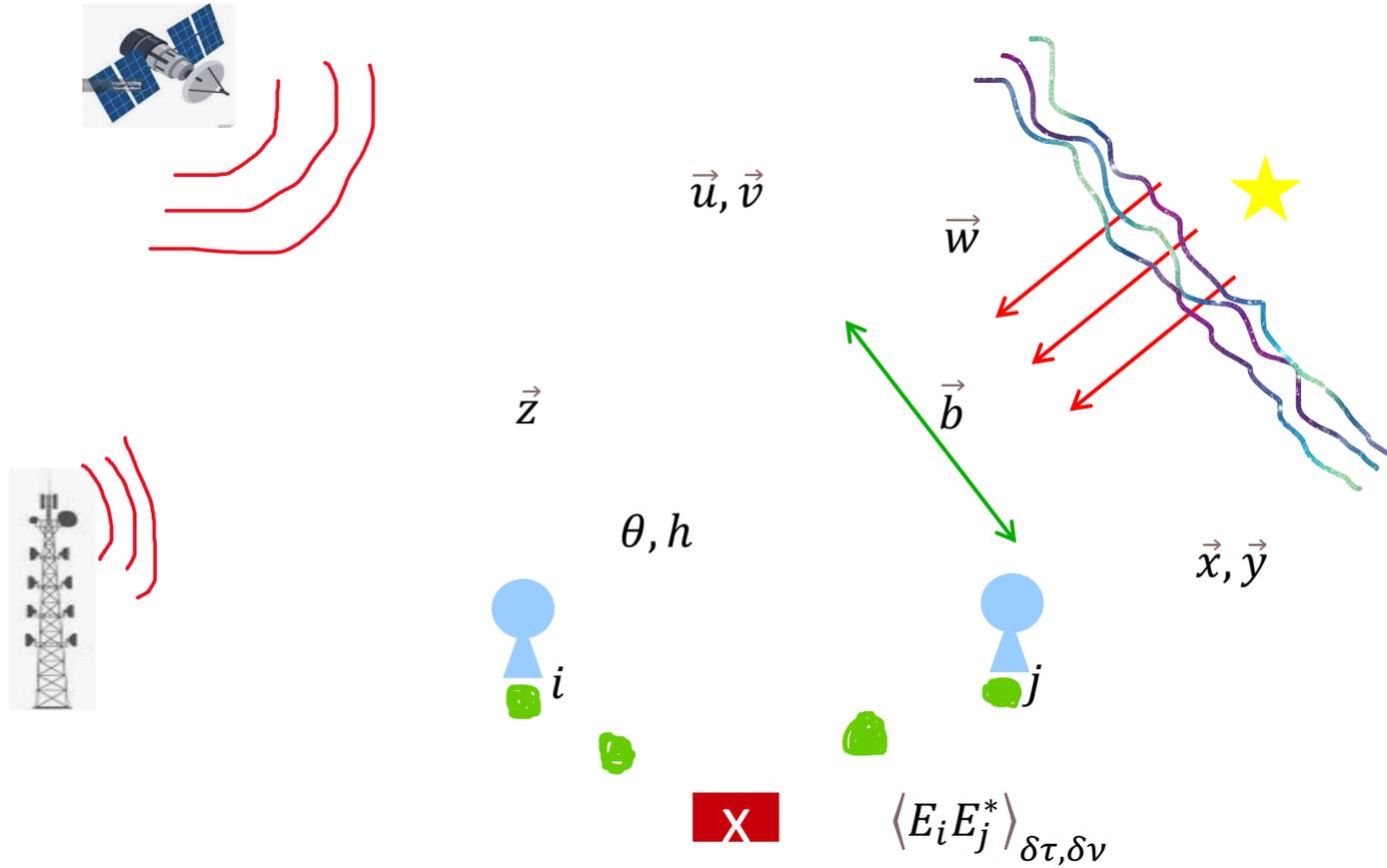
# Data Analysis

The measured  $\langle E_i E_j^* \rangle$  values are imperfect and incomplete



# Data Analysis

The measured  $\langle E_i E_j^* \rangle$  values are imperfect and incomplete



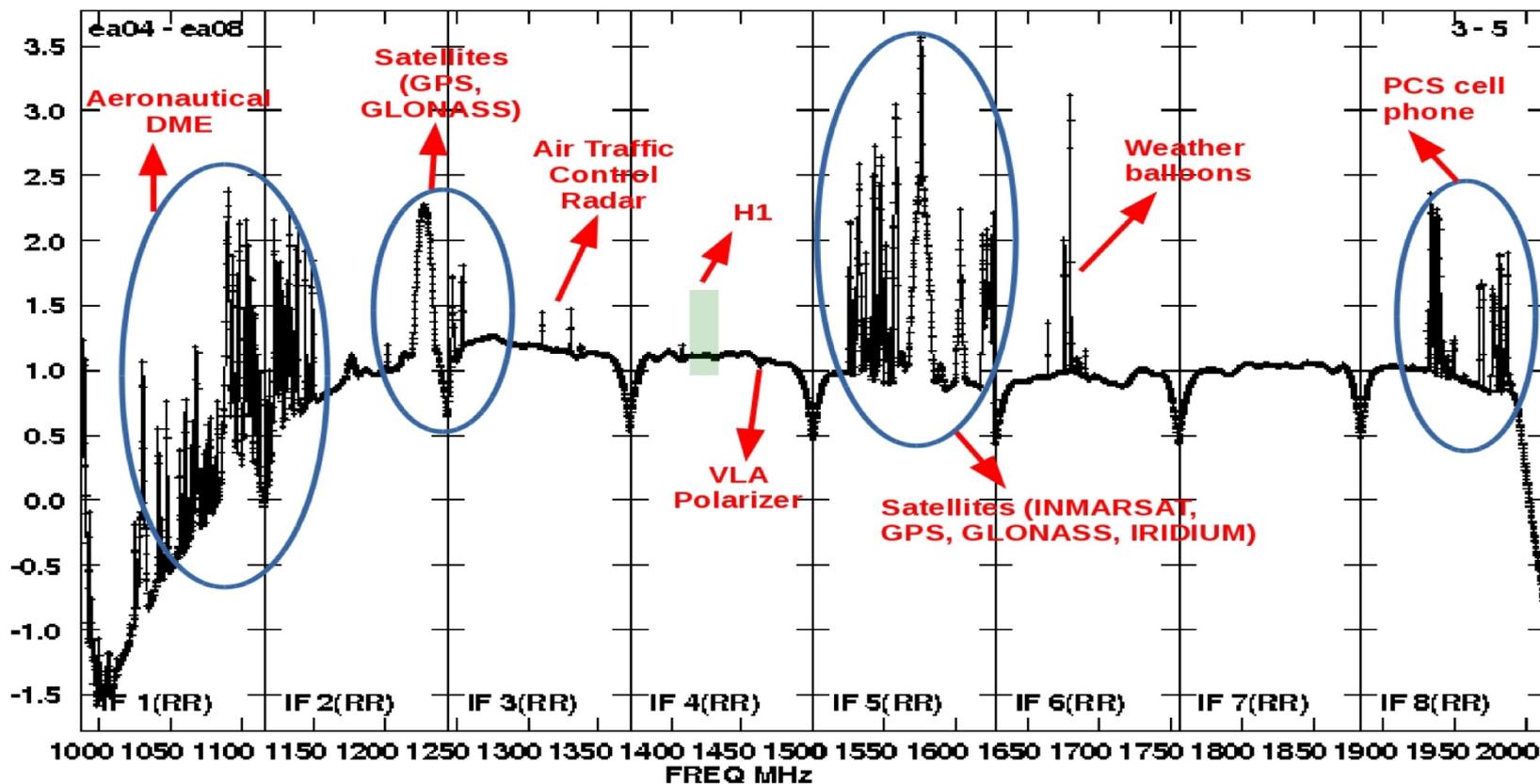
# Data Analysis

The measured  $\langle E_i E_j^* \rangle$  values are imperfect and incomplete

## Flagging

Problem : Radio Frequency Interference (RFI)

Solution : Identify and discard corrupted data samples.



# Data Analysis

The measured  $\langle E_i E_j^* \rangle$  values are imperfect and incomplete

## Flagging

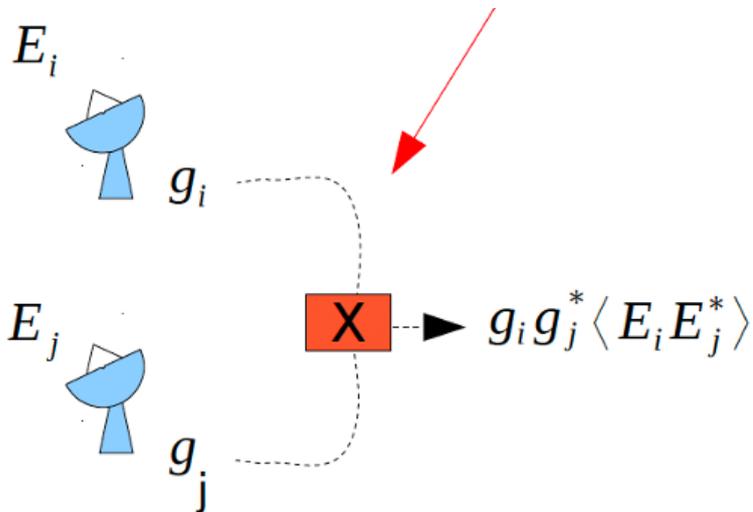
Problem : Radio Frequency Interference (RFI)

Solution : Identify and discard corrupted data samples.

## Calibration

Problem : Antenna electronics introduce complex gains  $g_i$

Solution : Numerically solve for antenna gains  $g_i$  and apply corrections



- Observe a source where  $\langle E_i E_j^* \rangle$  is known
- Use information from all  $ij$  to solve for  $g_i$
- Divide out  $g_i g_j^*$  from target data

# Data Analysis

---

The measured  $\langle E_i E_j^* \rangle$  values are imperfect and incomplete

## Flagging

Problem : Radio Frequency Interference (RFI)

Solution : Identify and discard corrupted data samples.

## Calibration

Problem : Antenna electronics introduce complex gains  $g_i$

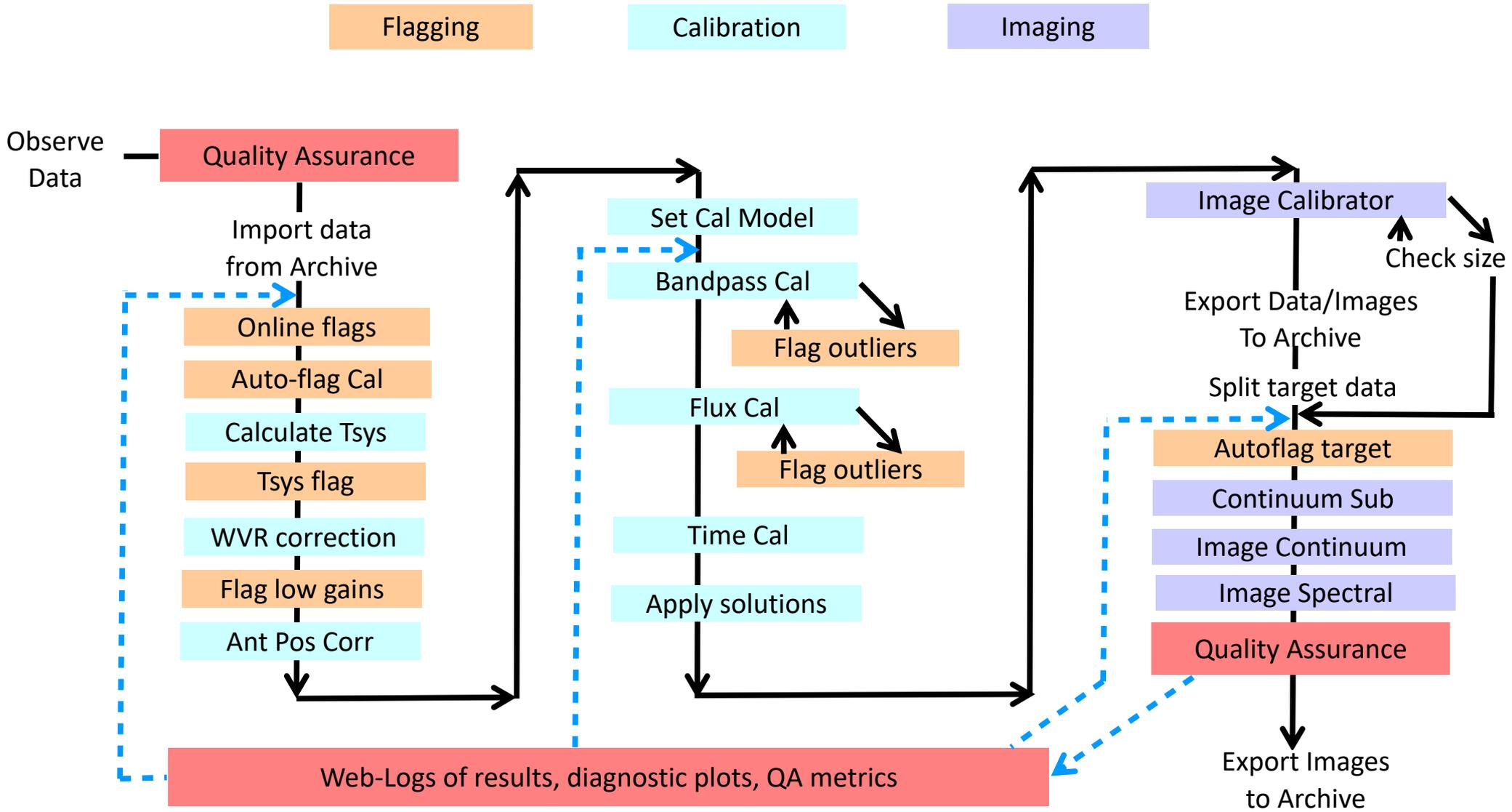
Solution : Numerically solve for antenna gains  $g_i$  and apply corrections

## Imaging

Problem : Sampling of the 2D Fourier Transform is incomplete  
( only  $N(N-1)/2$  measurements per timestep and frequency channel )

Solution : Fit a model of the sky brightness to the measured data.

# Data Analysis - Pipelines



---

Build your own Interferometer !

# Build Your Own Interferometer !

## Array configuration

Spiral  x ▼

32 antennas  x ▼

## Source Declination



## Observation Hour-Angle Range



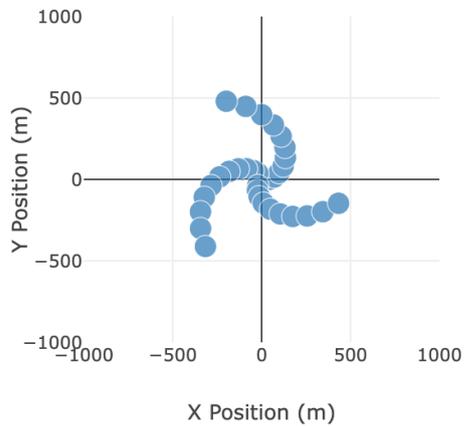
## Observatory Latitude



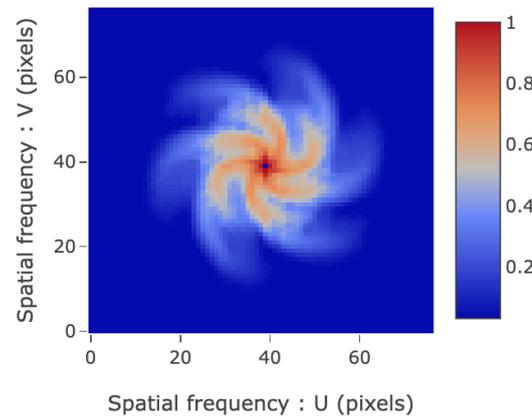
## Observation Bandwidth



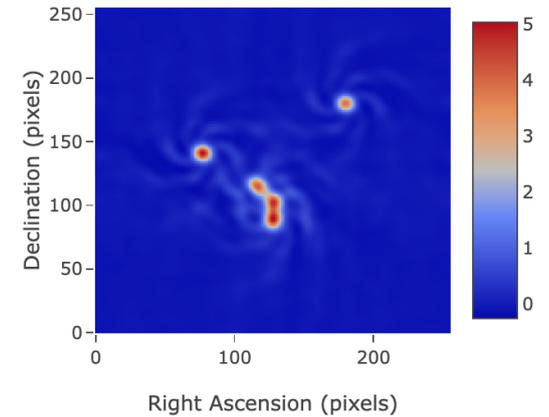
## ARRAY CONFIGURATION



## SPATIAL FREQUENCY COVERAGE



## OBSERVED IMAGE



## Expand or shrink the array layout



## Density Weighting



## Object to observe

One Point Source  Few Points  Multi-Scale



( <https://github.com/urvashirau/ImagingSimulator> )

# Build Your Own Interferometer !

How does the antenna layout and count affect

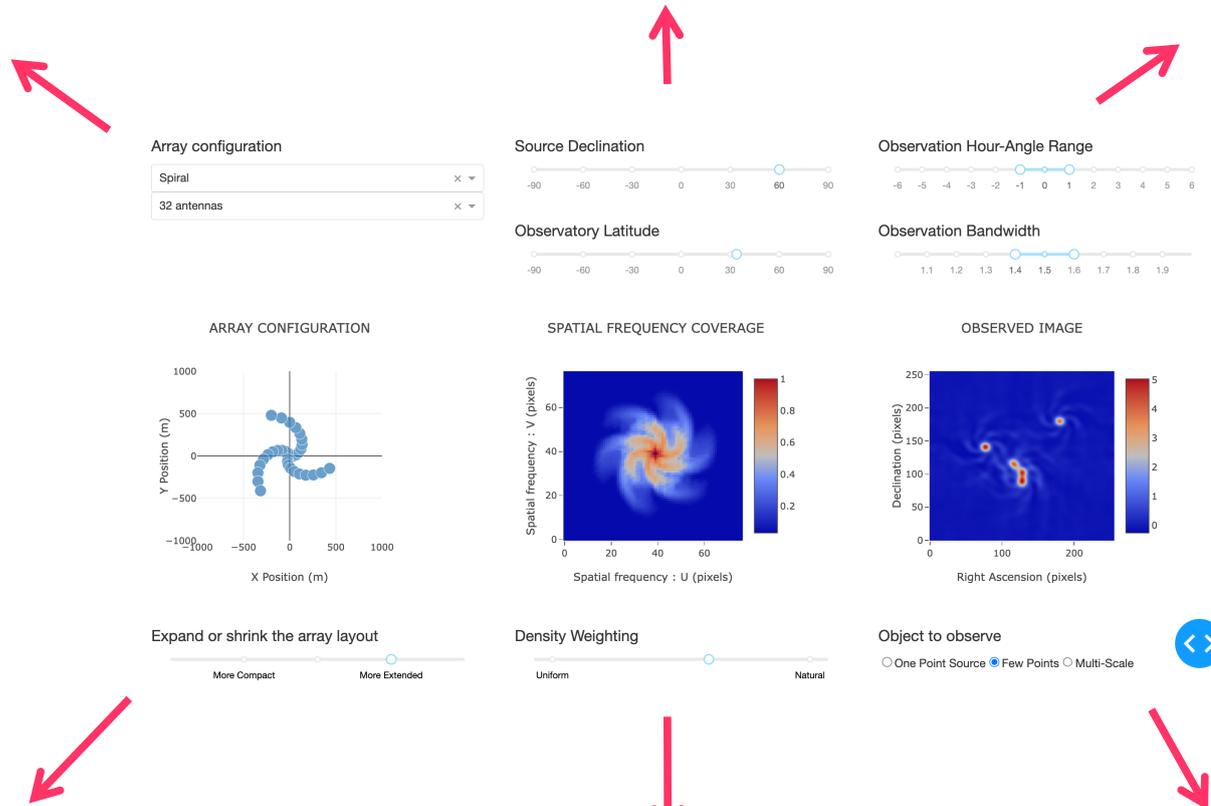
- UV-coverage
- Point Spread Function

Change relative orientation of the array and the object

- Projection effects

Effect of aperture Synthesis

- Change time-ranges
- Change bandwidth



Effect of a compact versus spread-out configuration

- Angular resolution

Different weighting schemes

- What features can be emphasized ?

Point sources versus extended emission

- Spatial scales
- Point Spread Function

---

Questions ?

# Some points to remember ...

---

How does an interferometer form an image ?

- Each antenna pair measures one 2D fringe.  
Many antenna pairs => Fourier series

How do you make a raw image from interferometer data ?

- Bin (or resample) the visibility data onto a 2D grid, take a Fourier transform

What does the raw observed image represent ?

- Observed Sky is the convolution of the true sky and the PSF

How do you get a model of the sky ?

- Solve the convolution equation via model-fitting algorithms like Clean

# Some points to remember ...

---

What is calibration ?

- Use calibrator data to solve for antenna gains, apply them to target data

How does wide-band data affect the imaging process ?

- Increased sensitivity, but the imaging properties and sky change with frequency

What is an antenna primary beam and what is its effect on an image ?

- Antenna power pattern. It multiplies with the sky, before convolution with the PSF

What is the w-term problem ?

- 2D Fourier transform approximations are invalid far away from the image center