



## Introduction to Imaging

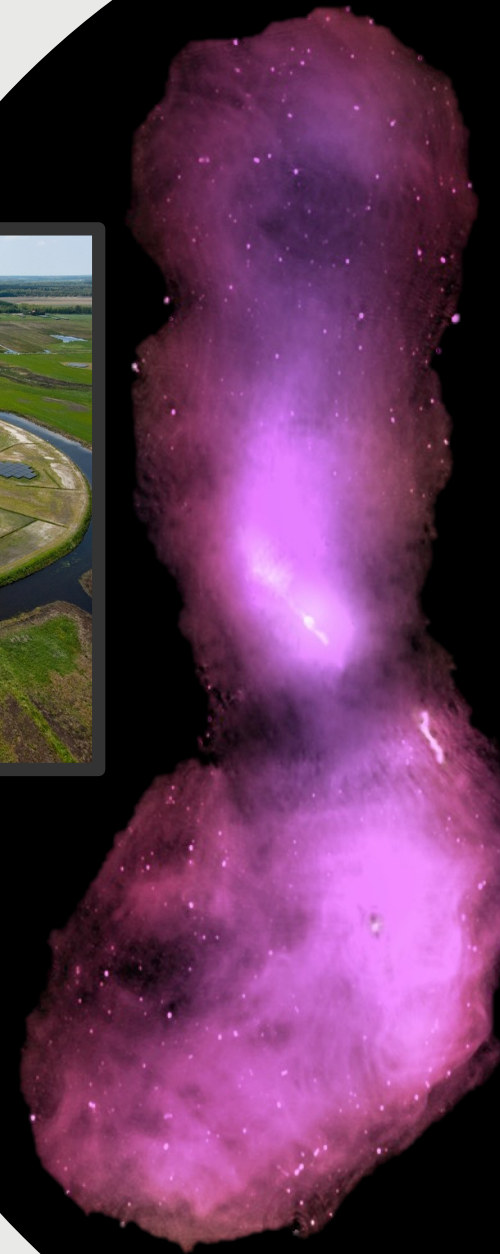
Joe Callingham (ASTRON)

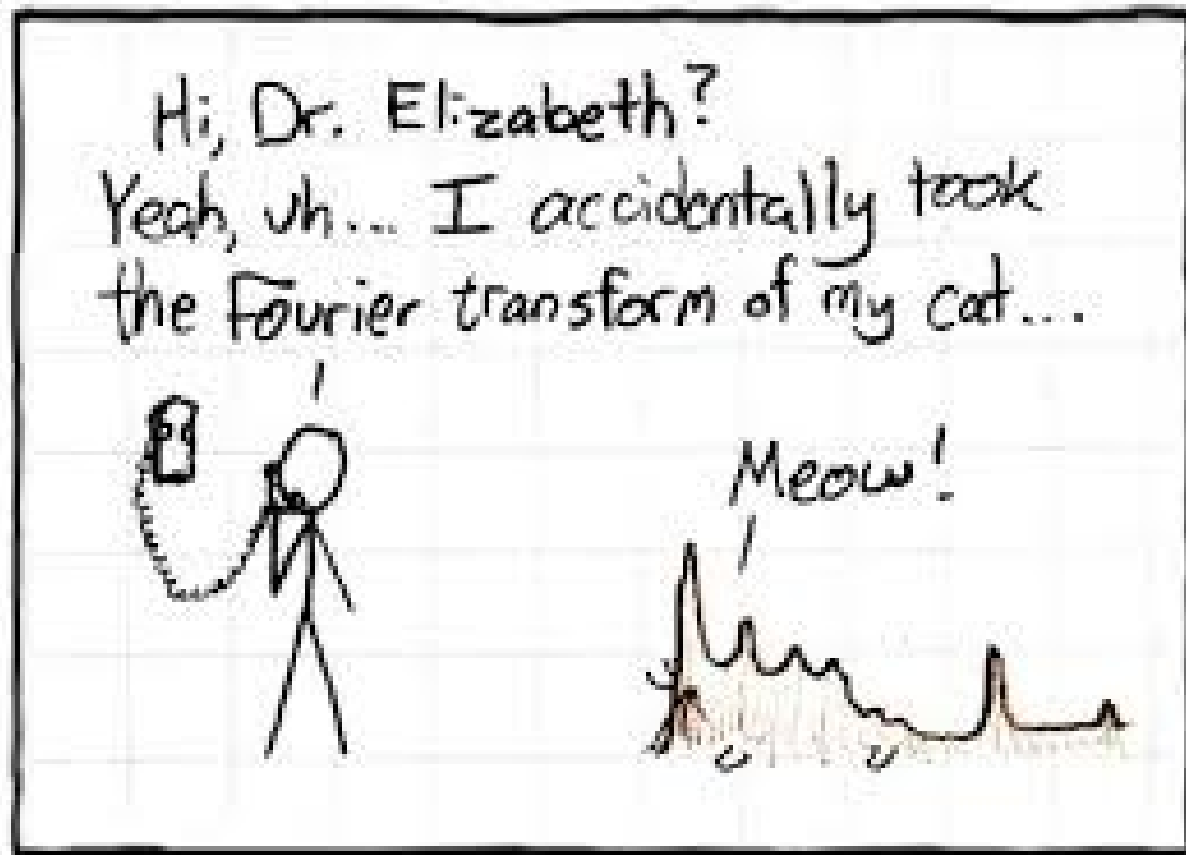
*Kenyan Radio Astronomy School,  
Nairobi, Kenya  
30<sup>th</sup> of May 2018*

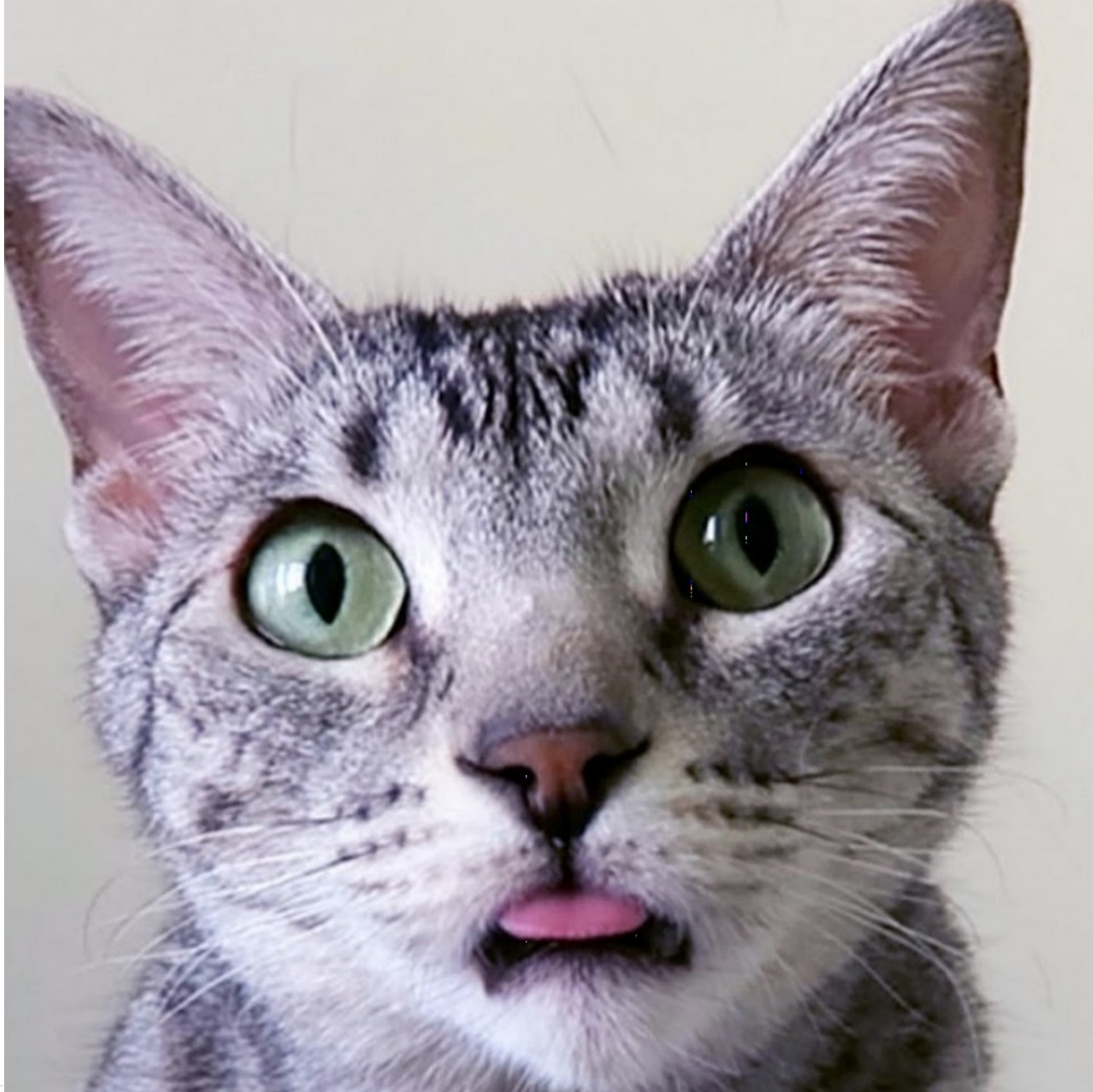
Thanks to Jack Radcliffe, Anna Scaife, and  
David Wilner



UNIVERSITY OF LEEDS





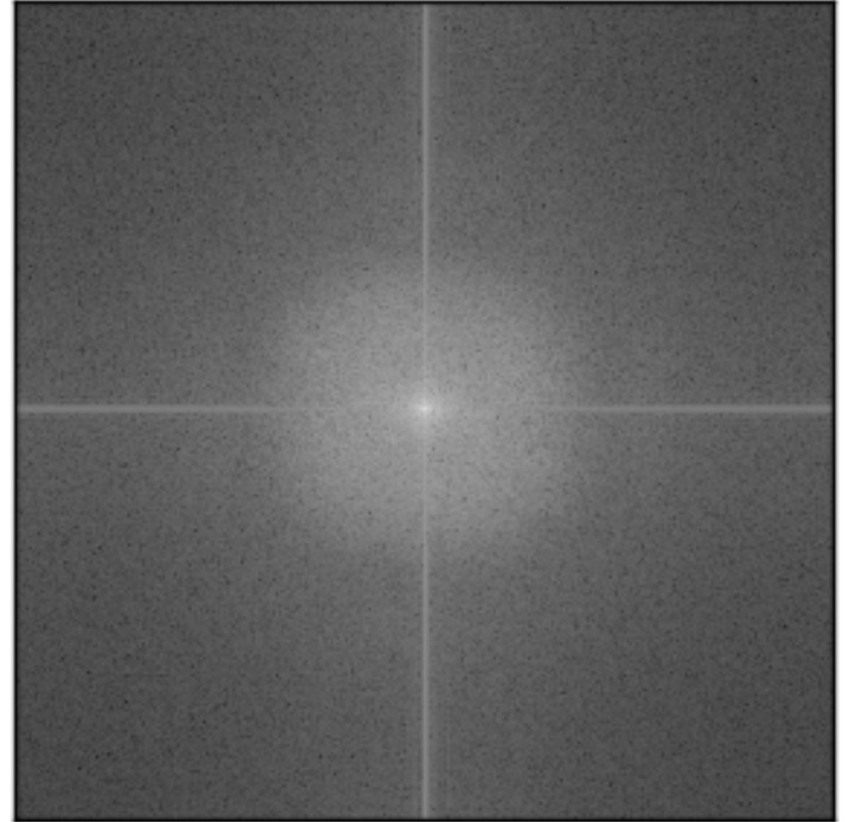


**Disclaimer:** This is not my cat.

Cat



Fourier Cat

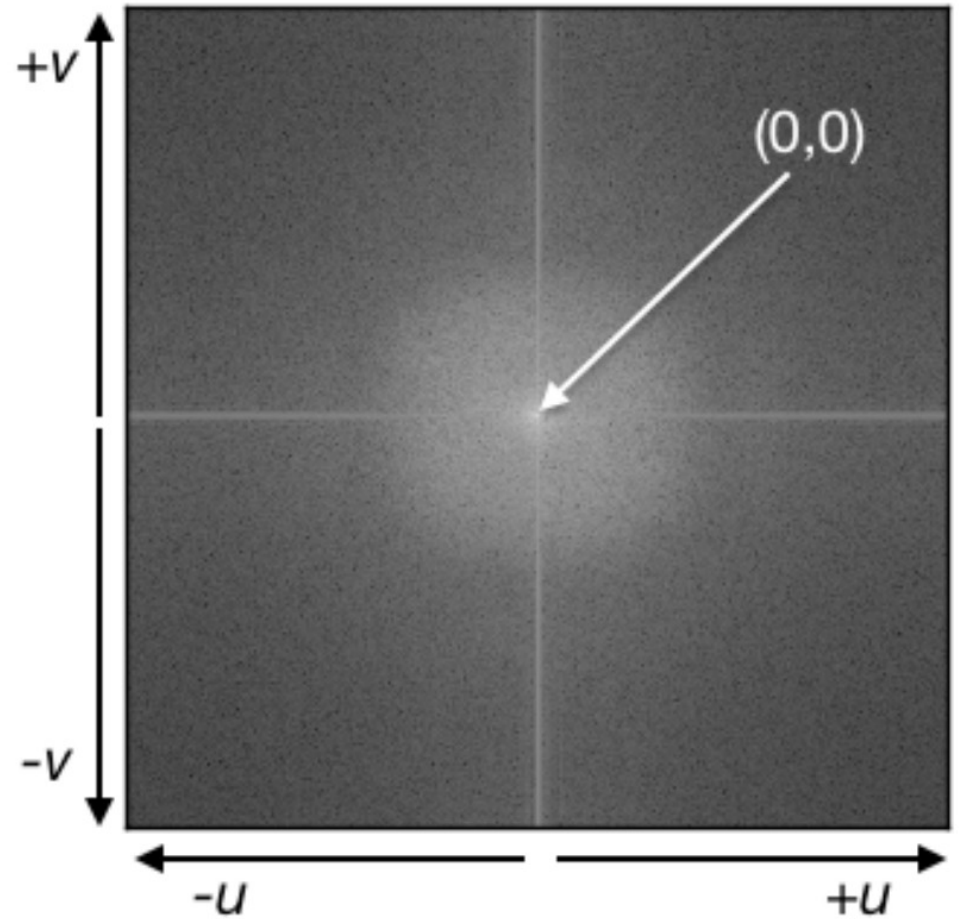




Cat



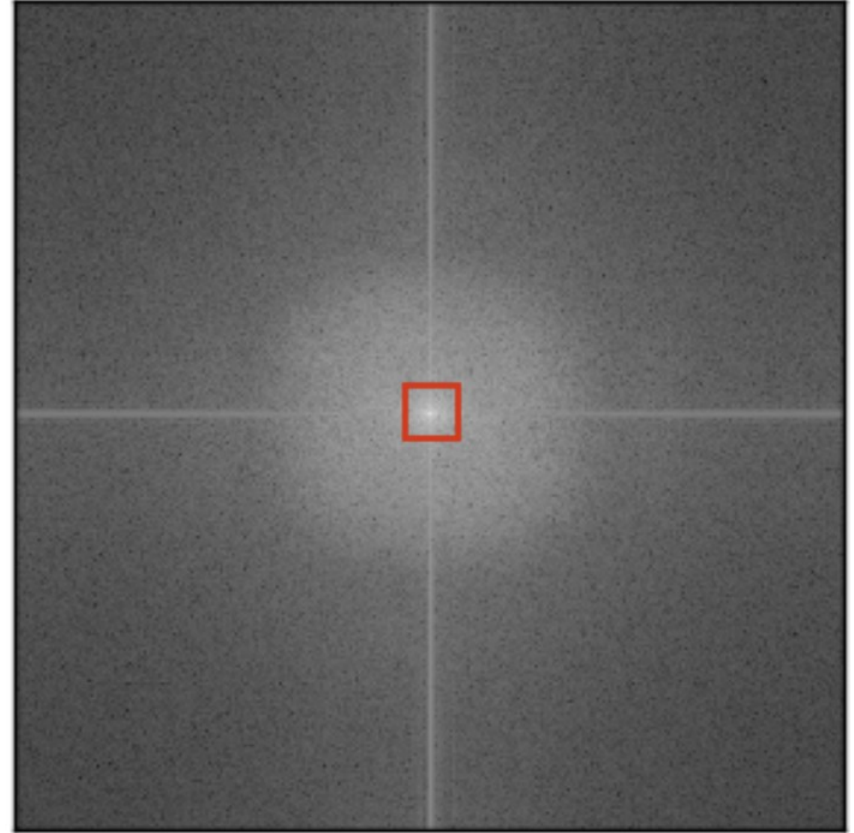
Fourier Cat



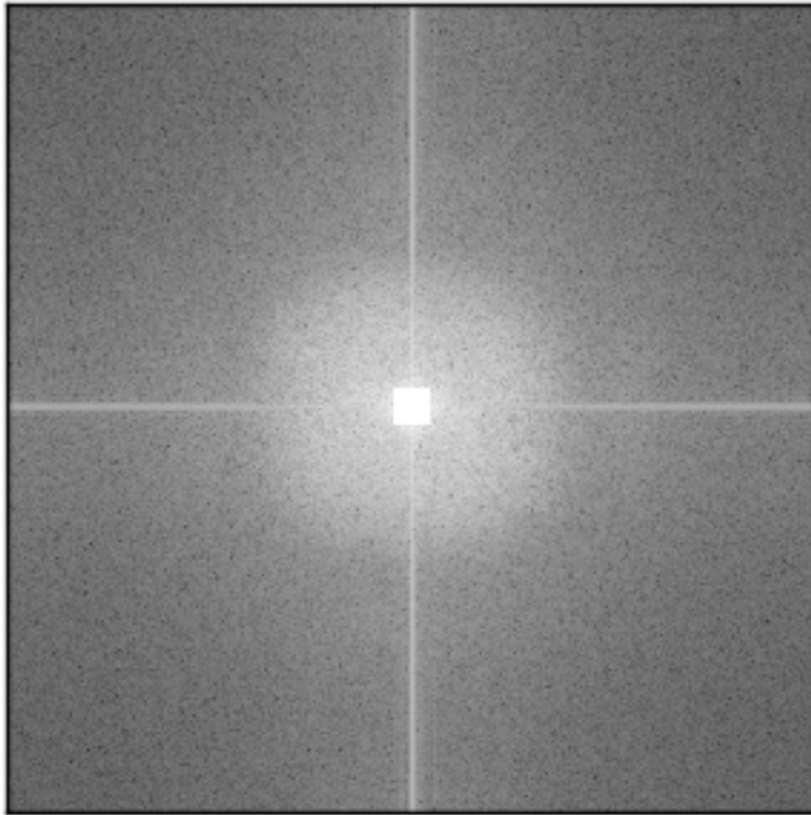
Cat



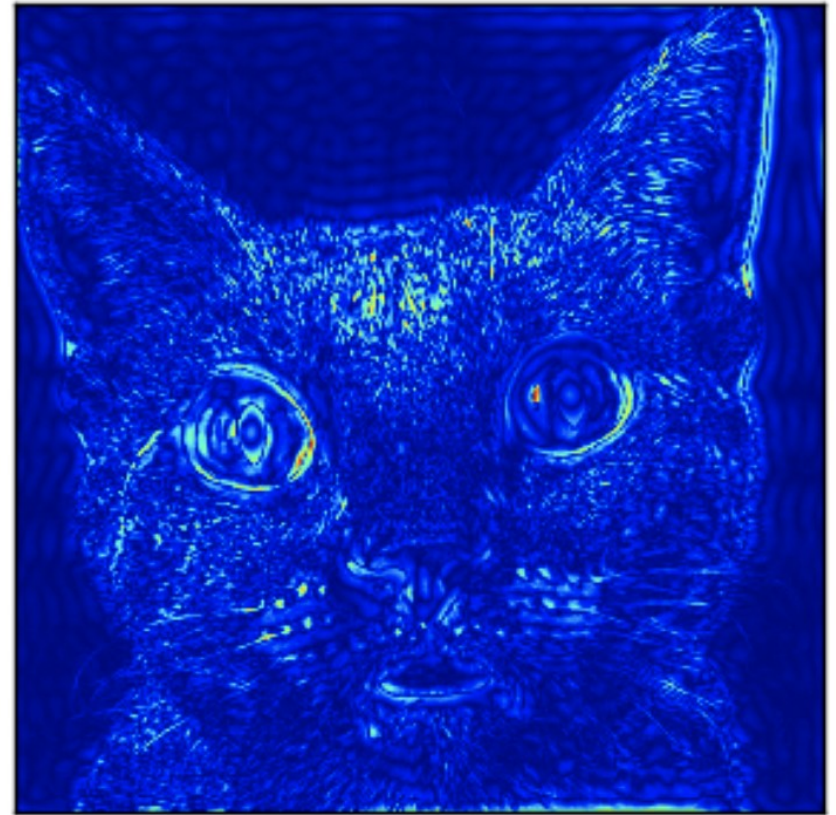
Fourier Cat



Filtered Fourier Cat

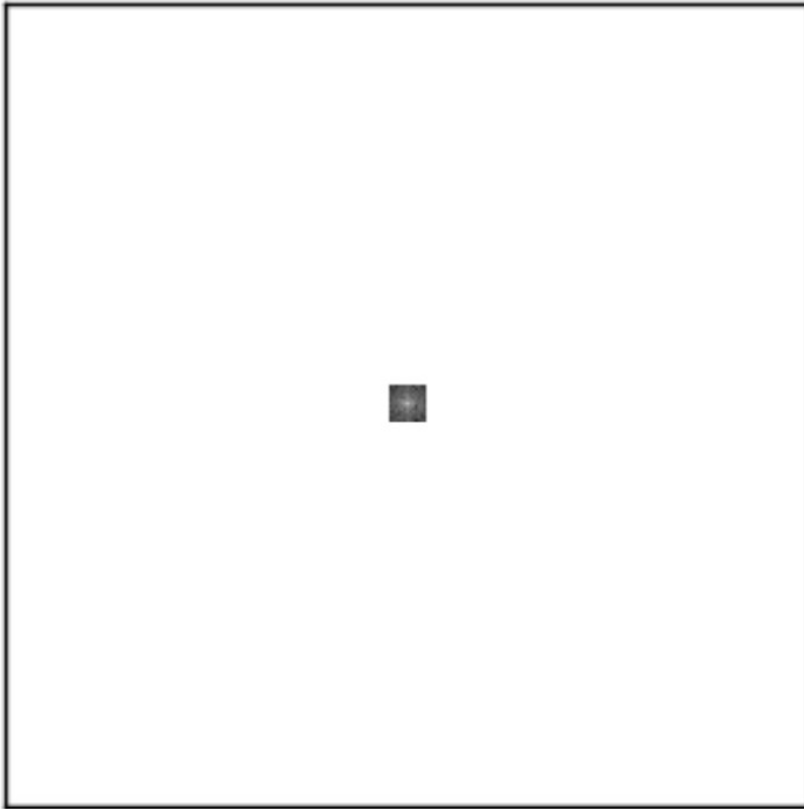


HPF Cat

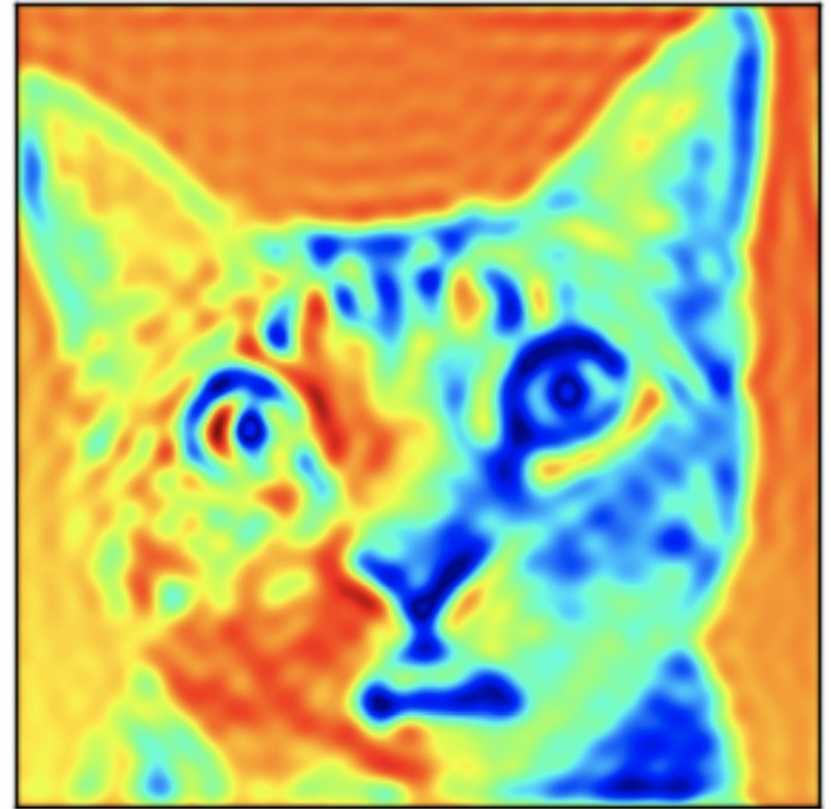




Filtered Fourier Cat



LPF Cat



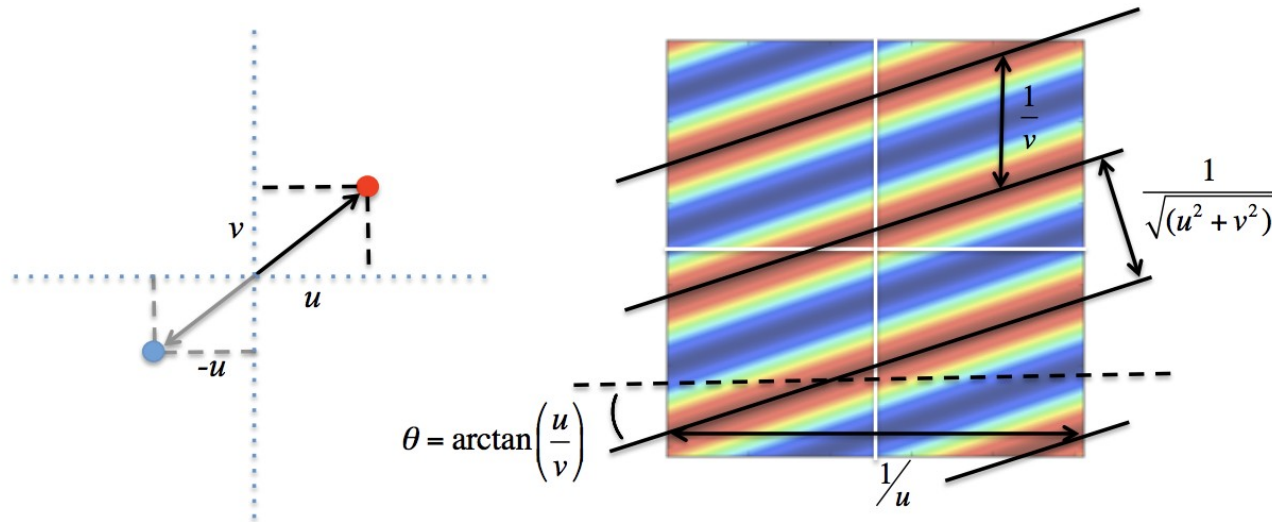


Small Fourier Frequencies = Large Scale Image Structure  
Large Fourier Frequencies = Small Scale Image Structure

Big is Small & Small is Big

# Visibilities

## FOURIER COMPONENTS

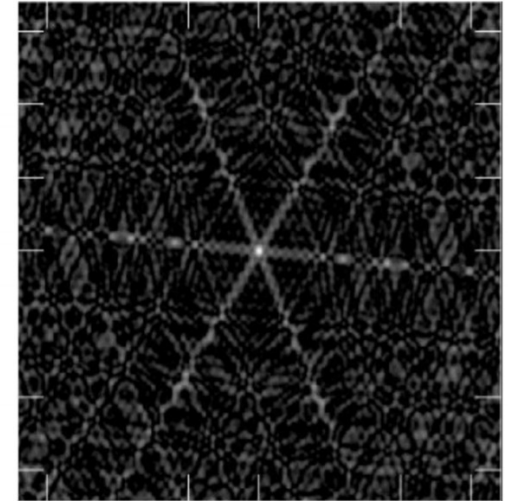
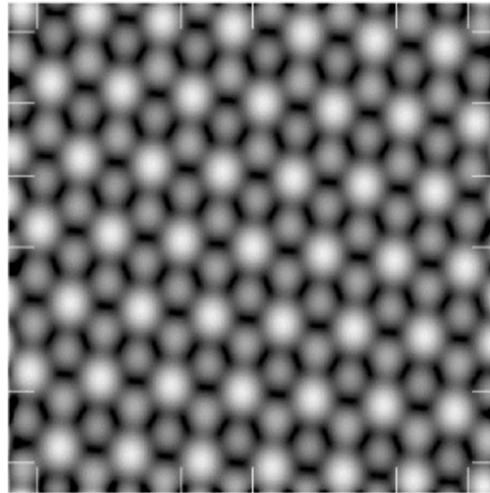
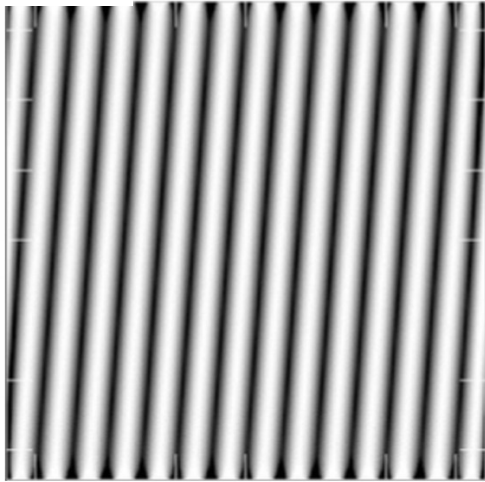


Writing the equation in this way allows us to visualise how our image is composed.

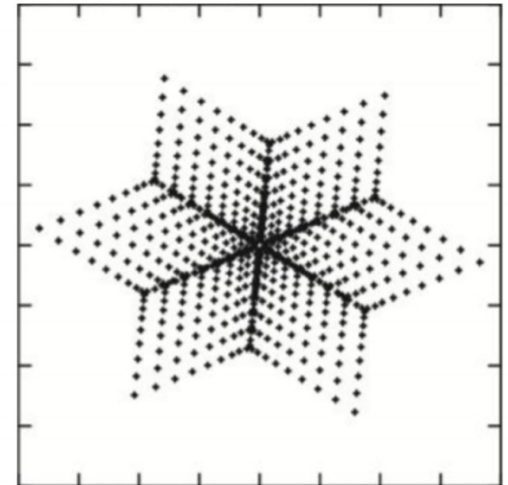
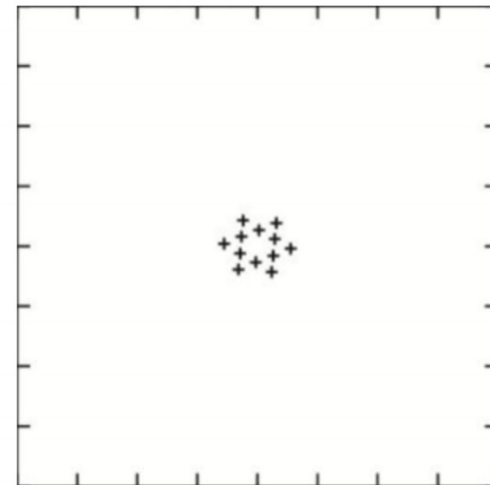
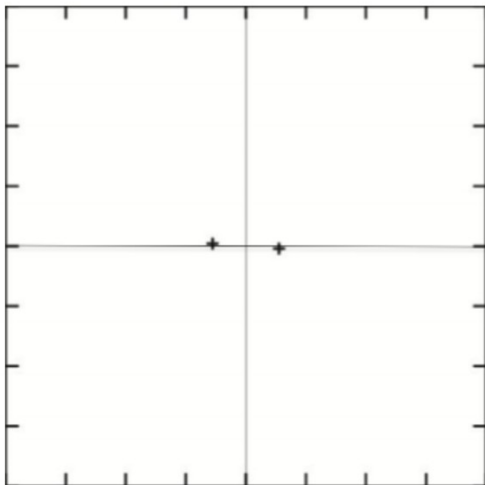
$$I_{meas}(l, m) = \frac{1}{M} \sum_{i=1}^M A(u_i, v_i) \cos[2\pi(u_i l + v_i m) + \phi_i]$$

## SYNTHESISED BEAM

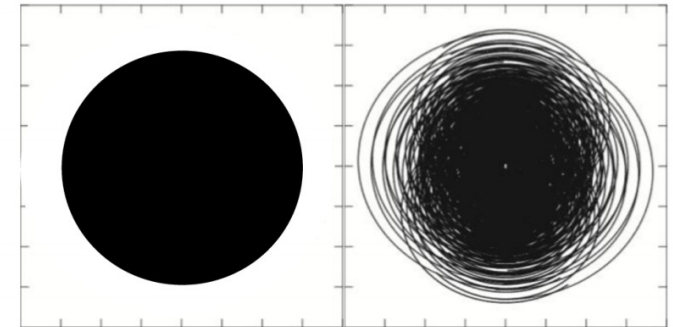
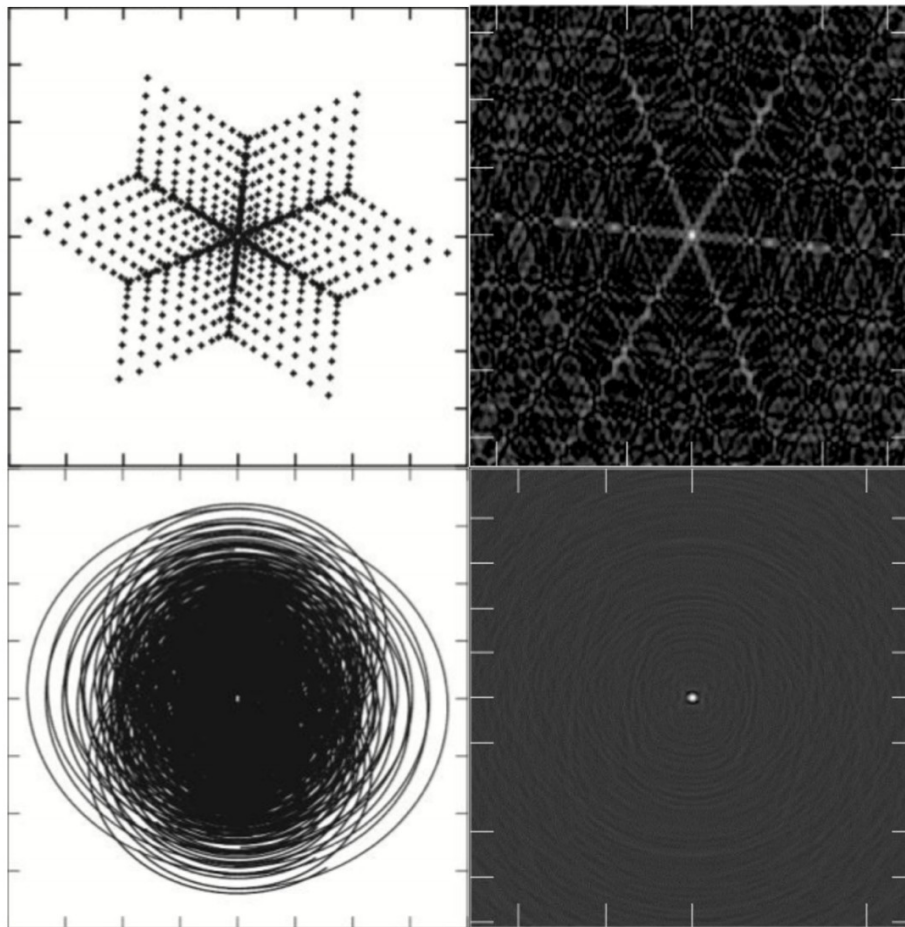
$\text{FT}^{-1}[S(u,v)]$



$S(u,v)$



# SYNTHESISED BEAM

 $S(u, v)$  $\text{FT}^{-1}[S(u, v)]$ 

The baseline ( $uv$ ) sampling defines the measured angular scales and sets the resolution.

Disambiguation:

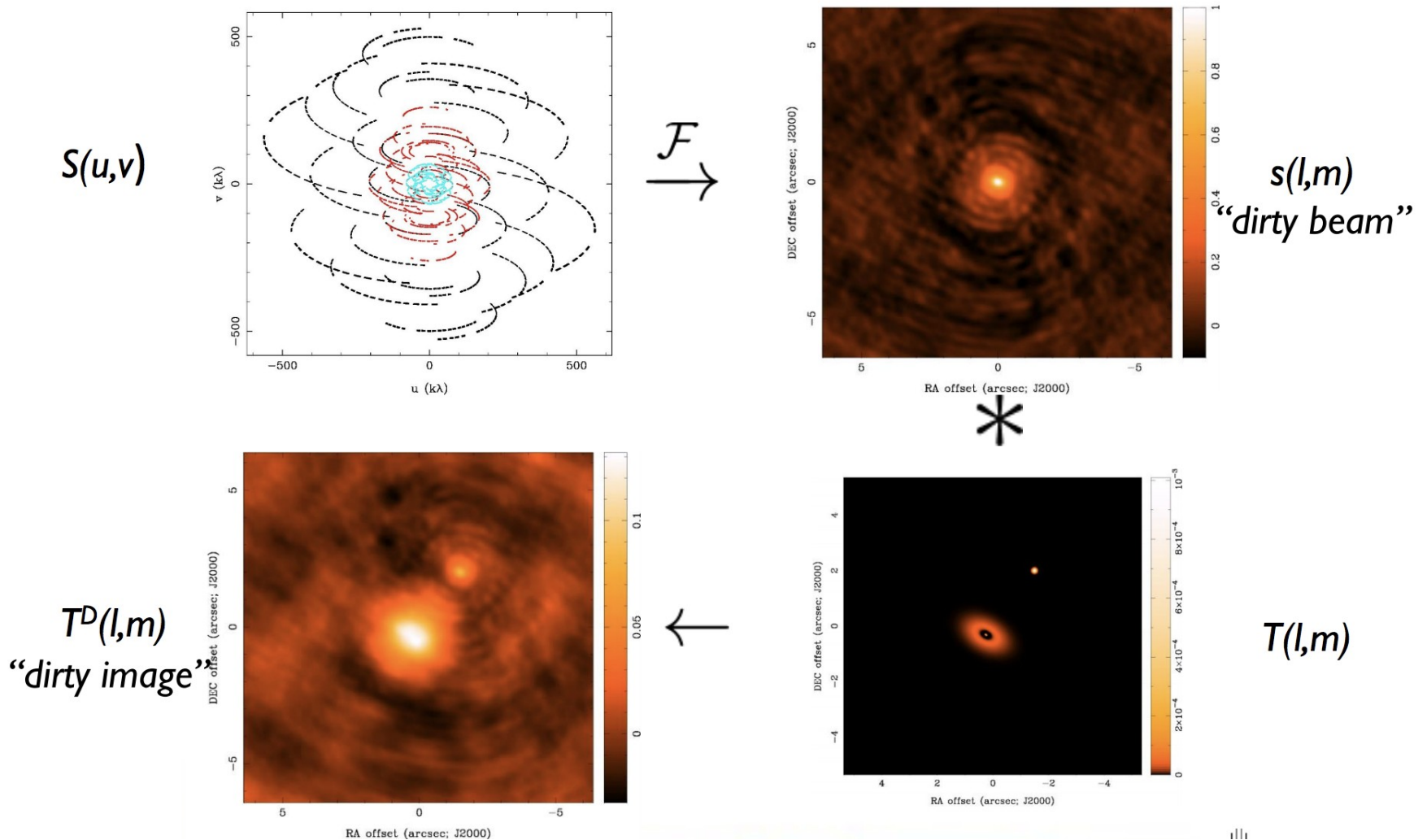
Synthesized beam

= point spread function

= dirty beam

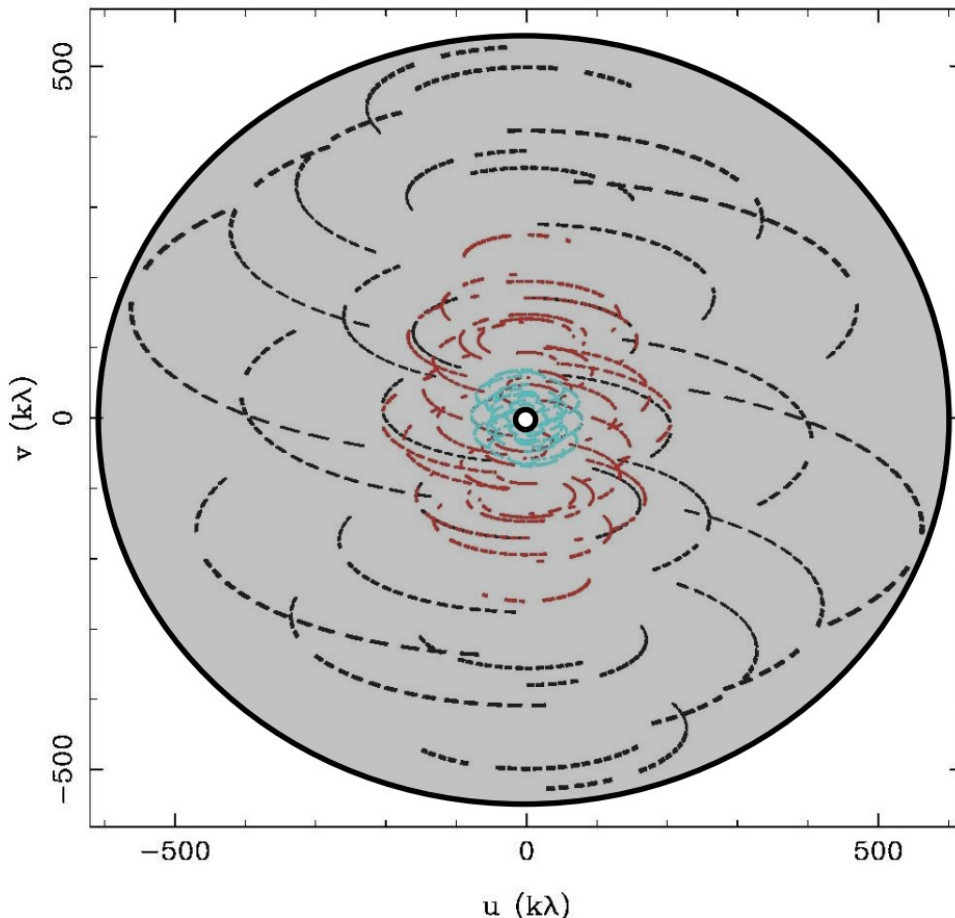


## Dirty Beam and Dirty Image



# IMPLICATIONS OF UV SAMPLING

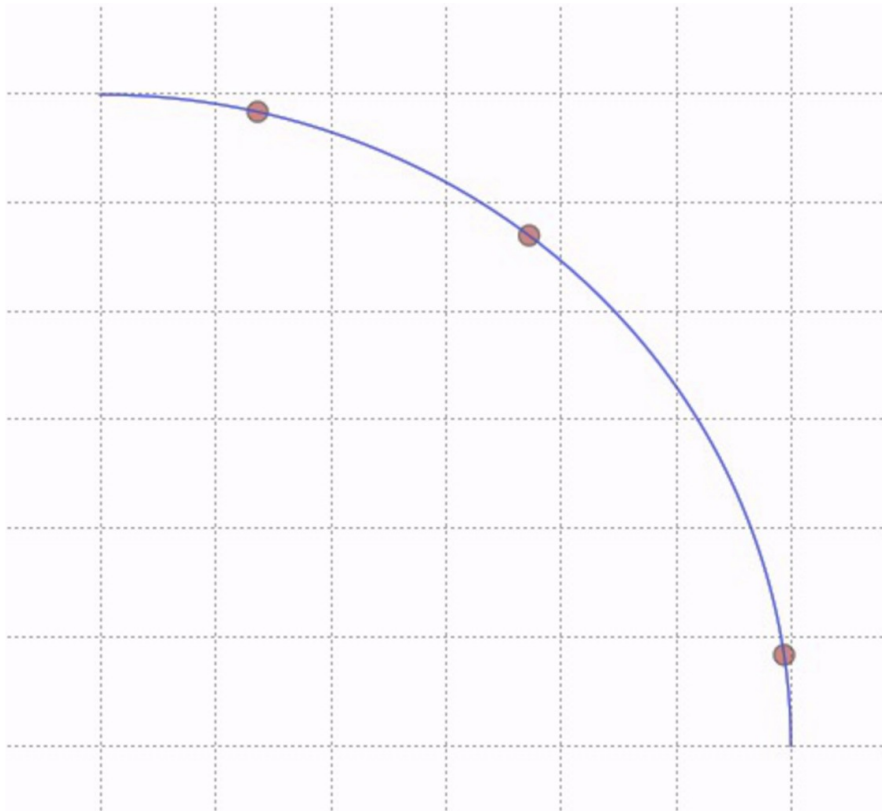
samples of  $V(u,v)$  are limited by number of antennas and by Earth-sky geometry



- *outer boundary*
  - no information on smaller scales
  - resolution limit
- *inner hole*
  - no information on larger scales
  - extended structures invisible
- *irregular coverage between boundaries*
  - sampling theorem violated
  - information missing

# GRIDDING

FFTs are faster but they also introduce complications.



FFTs require regularly spaced  $(u,v)$  data.

Interferometer data can be regularly spaced in time and frequency, but are not regularly spaced in  $u$  and  $v$ .

In order to use an FFT we need to GRID our data. This causes its own issues...

The basic operation of an (ideal) interferometer baseline measures (small sky approximation,  $w \rightarrow 0$ ):

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

We can, in principle, measure  $I(l, m)$  for all  $u, v$ . We can then use a Fourier transform to recover the sky brightness distribution:

$$I(l, m) \approx \iint V(u, v) e^{2\pi i(ul + vm)} du dv$$

However  $V(u, v)$  is not known everywhere but is sampled at particular places on the  $u$ - $v$  plane



This sampling function can be described by  $S(u,v)$  and is equal to 1 when the  $uv$  plane is sampled and zero otherwise:

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

*the Fourier transform of the sampled visibilities yields the true sky brightness convolved with the point spread function*

$$I^{\sim}(l, m) = I(l, m) * B$$

Where  $B$  is known as the **'dirty beam'** or the **'point spread function'** and is the FT of the sampling function.

$$B(l, m) = \iint S(u, v) e^{2\pi i(ul + vm)} du dv$$

# CASA IMAGE CONSTRUCTION



```
# clean :: Invert and deconvolve images with selected algorithm
vis = '' # Name of input visibility file
imagename = '' # Pre-name of output images
outlierfile = '' # Text file with image names, sizes,
# centers for outliers
field = '' # Field Name or id
spw = '' # Spectral windows e.g. '0~3', '' is
# all
selectdata = True # Other data selection parameters
timerange = '' # Range of time to select from data
uvrange = '' # Select data within uvrange
antenna = '' # Select data based on antenna/baseline
scan = '' # Scan number range
observation = '' # Observation ID range
intent = '' # Scan Intent(s)

mode = 'mfs' # Spectral gridding type (mfs, channel,
# velocity, frequency)
nterms = 1 # Number of Taylor coefficients to
# model the sky frequency dependence
reffreq = '' # Reference frequency (nterms > 1), ''
# uses central data-frequency
gridmode = '' # Gridding kernel for FFT-based
# transforms, default='None'
niter = 500 # Maximum number of iterations
gain = 0.1 # Loop gain for cleaning
threshold = '0.0mJy' # Flux level to stop cleaning, must
# include units: '1.0mJy'
psfmode = 'clark' # Method of PSF calculation to use
# during minor cycles
imagermode = 'csclean' # Options: 'csclean' or 'mosaic', '',
# uses psfmode
cyclefactor = 1.5 # Controls how often major cycles are
# done. (e.g. 5 for frequently)
cyclespeedup = -1 # Cycle threshold doubles in this
# number of iterations

multiscale = [] # Deconvolution scales (pixels); [] =
# standard clean
interactive = False # Use interactive clean (with GUI
# viewer)
mask = [] # Cleanbox(es), mask image(s),
# region(s), or a level
imsize = [256, 256] # x and y image size in pixels. Single
# value: same for both
cell = ['1.0arcsec'] # x and y cell size(s). Default unit
# arcsec.
phasecenter = '' # Image center: direction or field
# index
restfreq = '' # Rest frequency to assign to image
# (see help)
stokes = 'I' # Stokes params to image (eg
# I,IV,IQ,IQUV)
weighting = 'natural' # Weighting of uv (natural, uniform,
# briggs, ...)
uvtaper = False # Apply additional uv tapering of
# visibilities
modelimage = '' # Name of model image(s) to initialize
# cleaning
restoringbeam = [''] # Output Gaussian restoring beam for
# CLEAN image
pbcpr = False # Output primary beam-corrected image
minpb = 0.2 # Minimum PB level to use
usescratch = False # True if to save model visibilities in
# MODEL_DATA column
allowchunk = False # Divide large image cubes into channel
# chunks for deconvolution
```

- clean is the CASA imaging routine
- To achieve a basic image, need to set:
  - vis - your data
  - imagename
  - niter - no. of CLEAN iterations (next slide)
  - imsize - size of the image in pixels (needs to be as small as possible to decrease computation time)
  - cell - angular extent of each pixel (need to adequately sample the psf)

Rule of thumb:

$$\text{cell} \sim \lambda_f / 3B$$

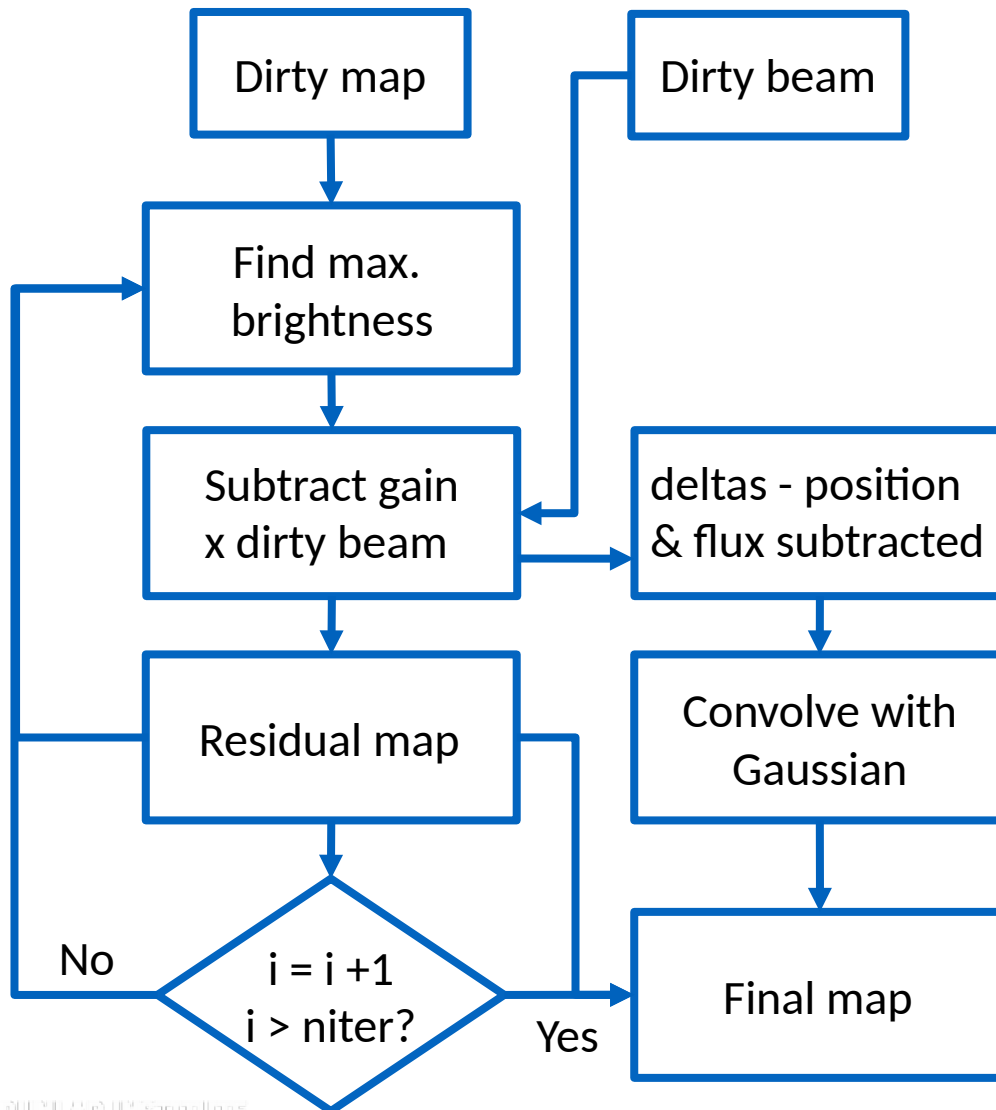
$\lambda_f$  - wavelength of highest frequency channel  
 $B$  - longest baseline length

To recover the real brightness distribution we just need to deconvolve...  
easier said than done:

- A vast number of images are consistent with the data inc. the dirty beam.
- We need to take a Bayesian approach - supply priors (i.e. extra information/ assumptions) so we can find the most probable brightness distribution.
- Simplest scheme (but not only): Sky is mostly **empty** and consists of a **finite number of unresolved point sources**.

→ The basis of the Hogbom CLEAN algorithm (1974)

## HOGBOM CLEAN & VARIANTS



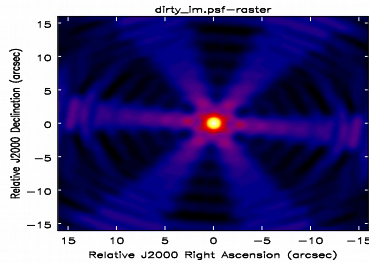
- initialize
  - a *residual map* to the dirty map
  - a *Clean Component* list
- 1. identify the highest peak in the residual map as a point source
- 2. subtract a fraction of this peak from the *residual map* using a scaled dirty beam,  $s(l,m) \times \text{gain}$
- 3. add this point source location and amplitude to the *Clean Component* list
- 4. goto step 1 (an iteration) unless stopping criterion reached



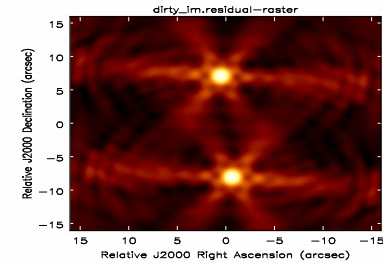
# CLEAN DECONVOLUTION

JVLA simulation, 2hr observation targeting two 0.1 Jy point sources + some phase corruption included

Dirty beam



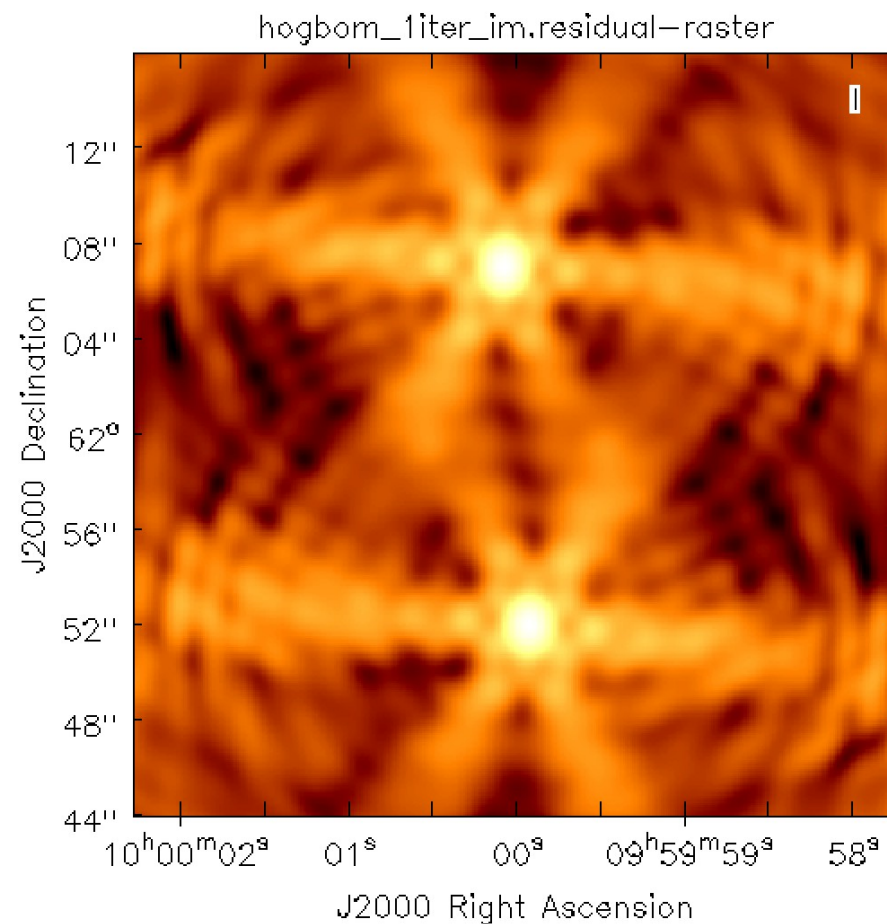
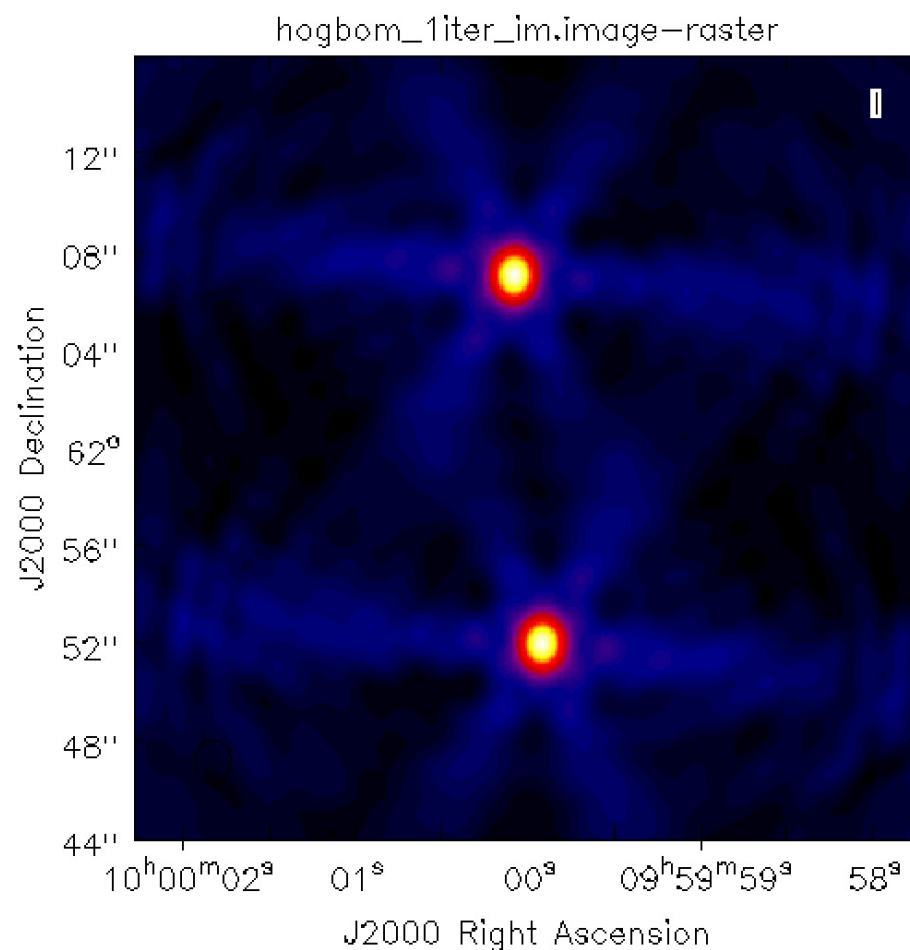
Dirty image



# CLEAN DECONVOLUTION

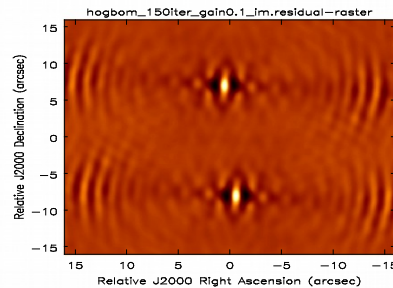
## Hogbom CLEAN

Image & residual after 1 iteration with 0.5 gain

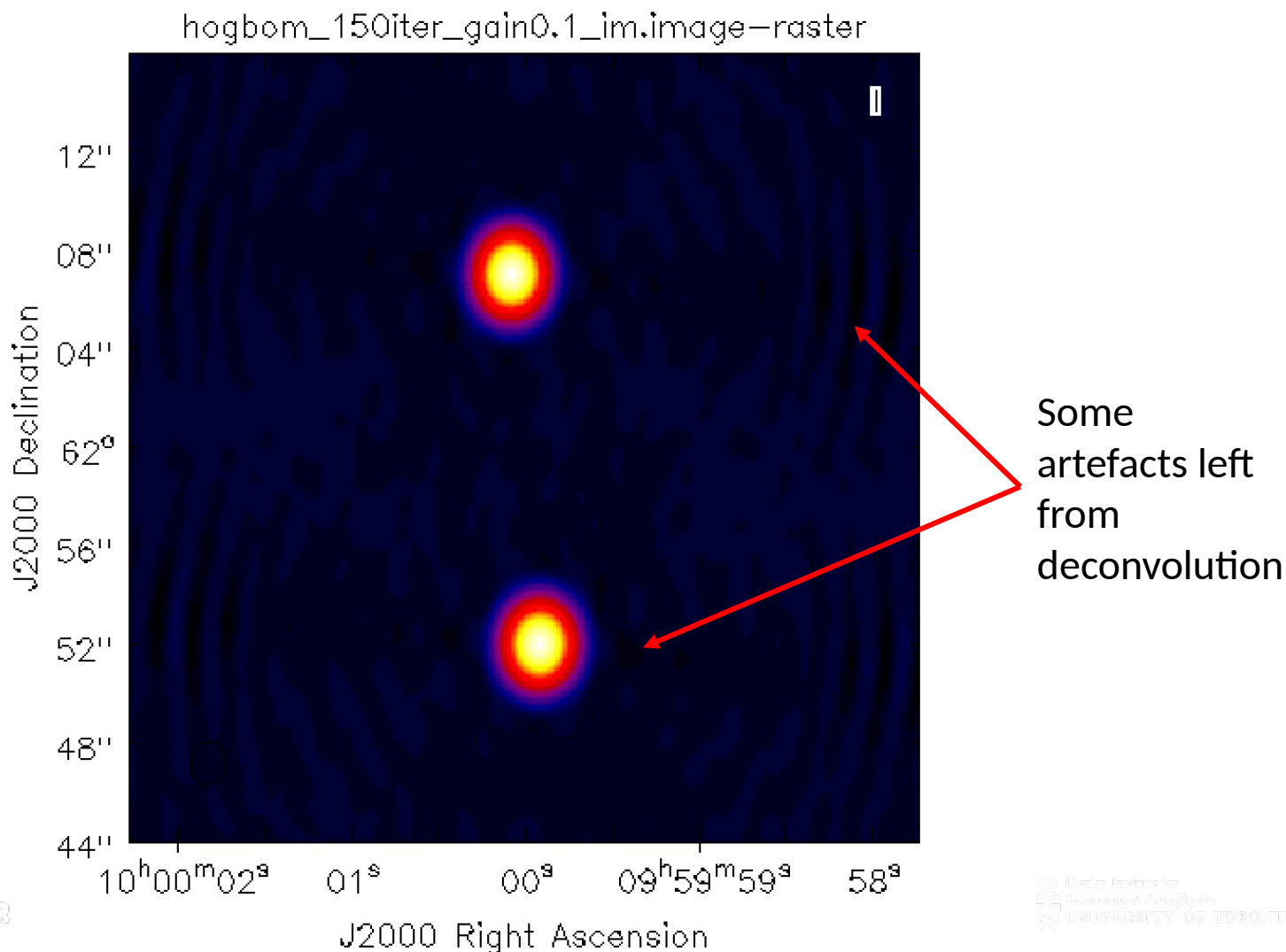


## Hogbom CLEAN

Residual after 150 iterations with 0.1 gain



CLEAN map (residual+CLEAN components) after 150 iterations



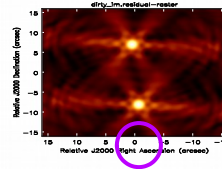


CLEAN is far from perfect, but we can lend it a hand:

CLEAN consists of two 'cycles':

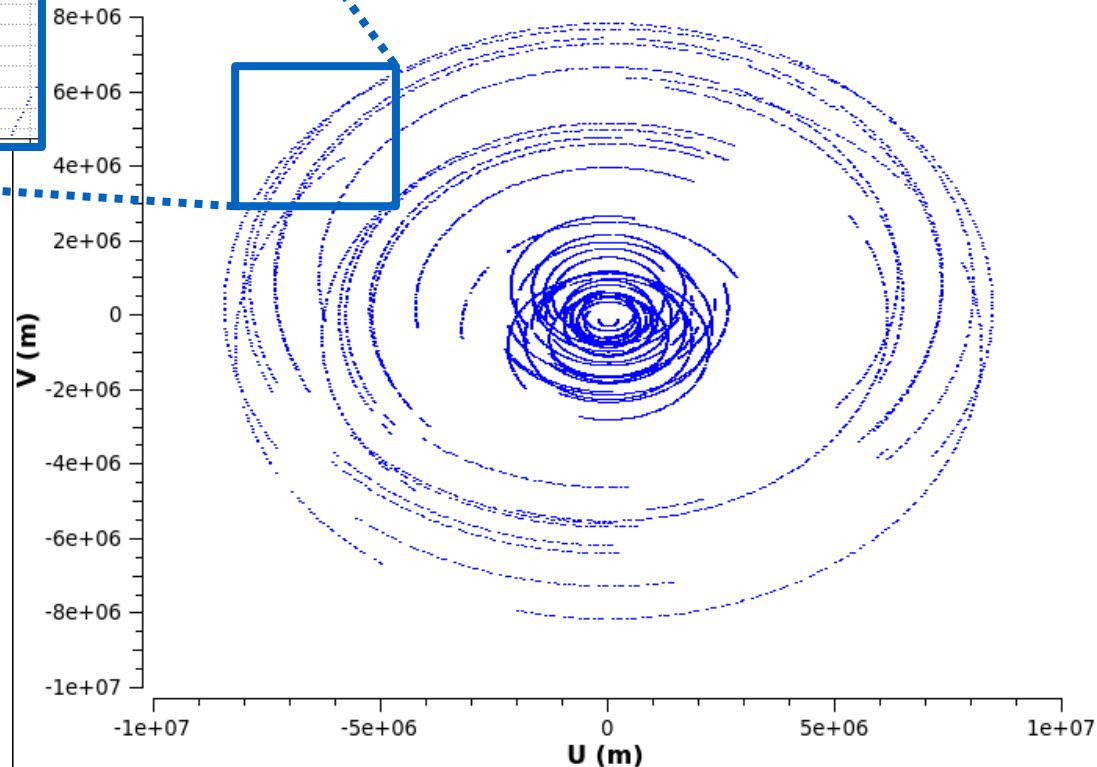
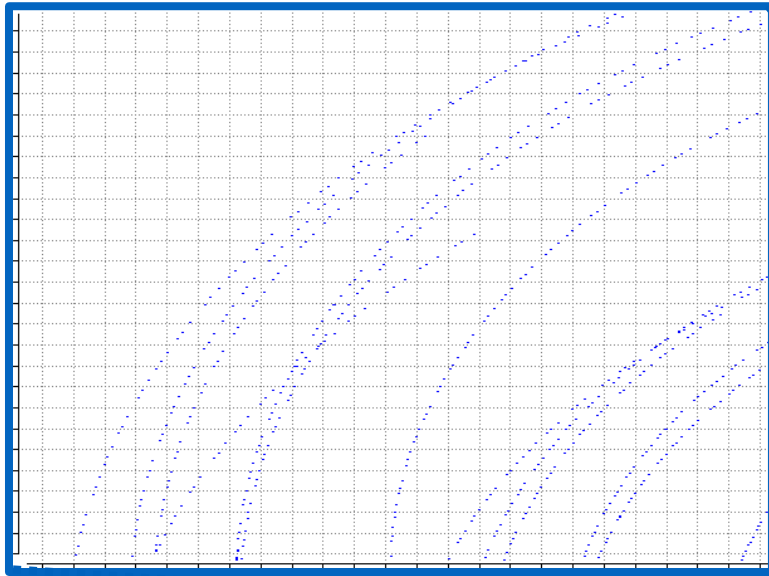
- I. Minor cycles - subtract subimages of the dirty beam
- II. Major cycles - Fourier Transform residual map and subtract

We can use windowing to tell the algorithm where the flux lies.  
This should be used when you **know** the flux you see is real!



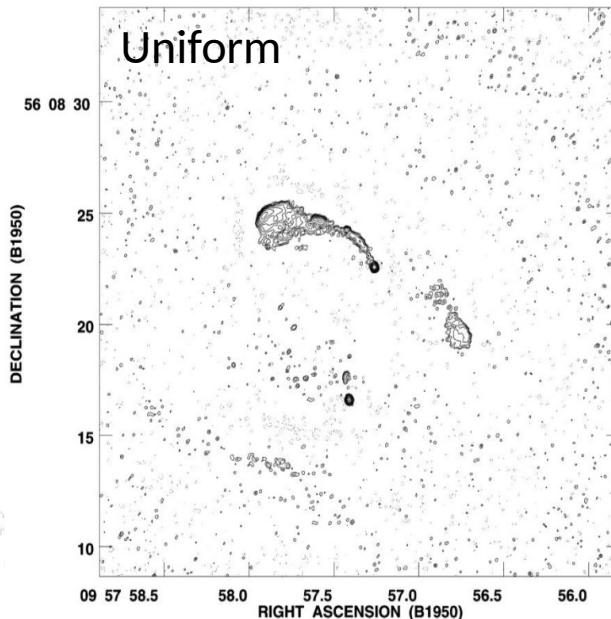
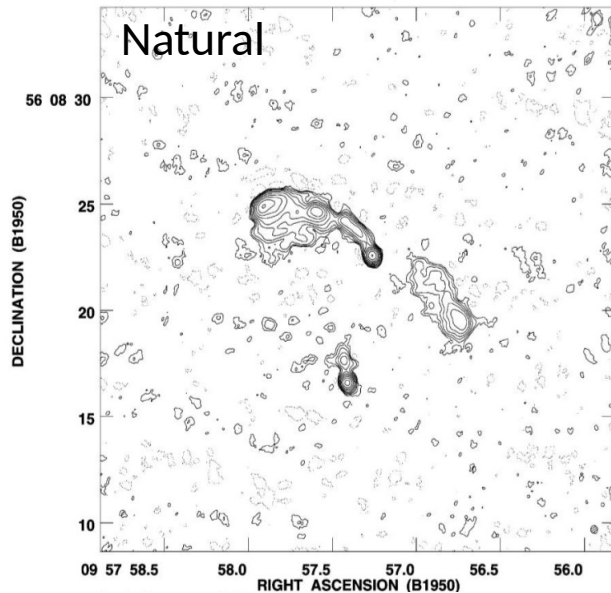
## 2. WEIGHTING

Integrations are distributed over a greater number of sampled grid points in the outer uv plane than the inner regions



- Data interpolated on  $2^n$  grid
- Weights unmodified by local density - 'Natural'
- Weights divided by local density of points - 'Uniform'

# UV WEIGHTING



Natural weighted images have low spatial frequencies are weighted up (due to gridding) and gives:

- Best S/N
- Worse resolution

Uniform weighted images low have spatial frequencies weighted down and the data are not utilised optimally (may be subject to a deconvolution striping instability)

resulting in:

- Worse S/N
- Best resolution

Compromises exist:

- Briggs (robust) weighting parameter -5 to +5. (next slide)

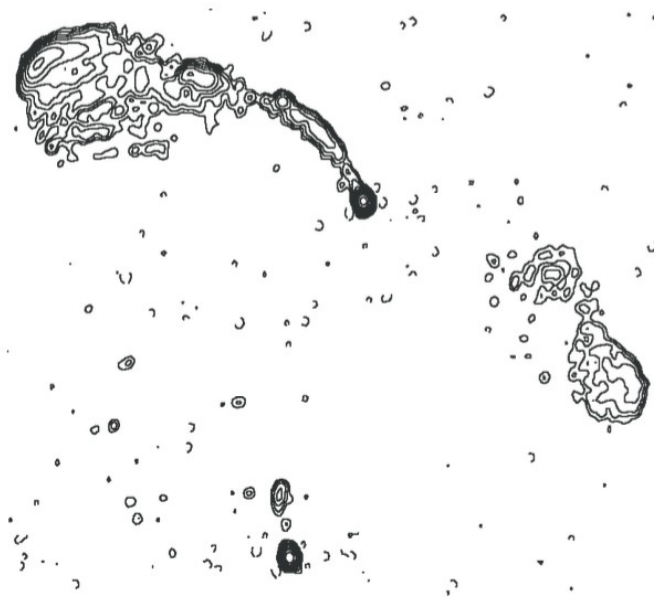
Implementation in CASA clean

```
weighting = 'natural'
```

```
# Weighting of uv (natural, uniform,  
# briggs, ...)
```

- Originally derived as a cure for striping – Natural weighting is immune and therefore most 'robust'
  - Varies effective weighting as a function of local u-v weight density
    - Where weight density is low – effective weighting is natural
    - Where weight density is high – effective weighting is uniform
  - Modifies the variations in effective weight found in uniform weighting → more efficient use of data & lower thermal noise
  - ROBUST = - 5 is nearly pure uniform ROBUST = + 5 is nearly pure natural  
ROBUST = 0 is a good compromise (Contoured)
- Can produce images close to uniform weighting resolution with noise levels close to natural weighting. See CASA [webpage](#) for other weighting schemes!

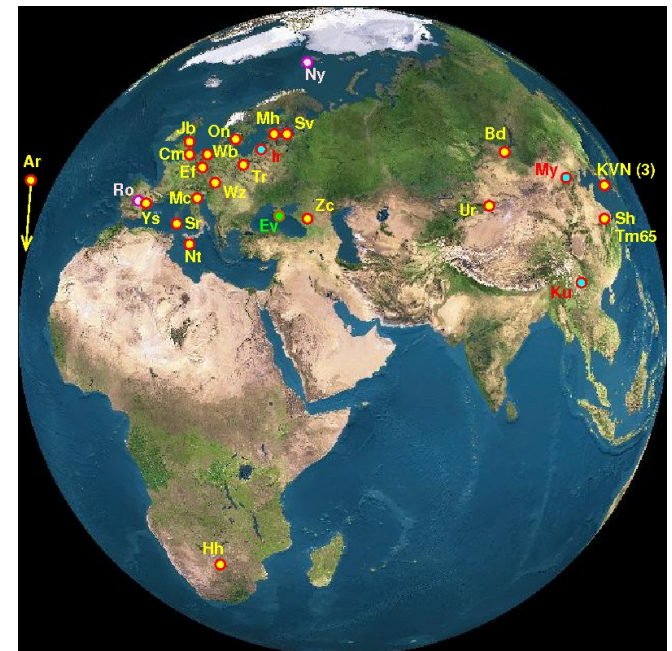
Robust 0 image





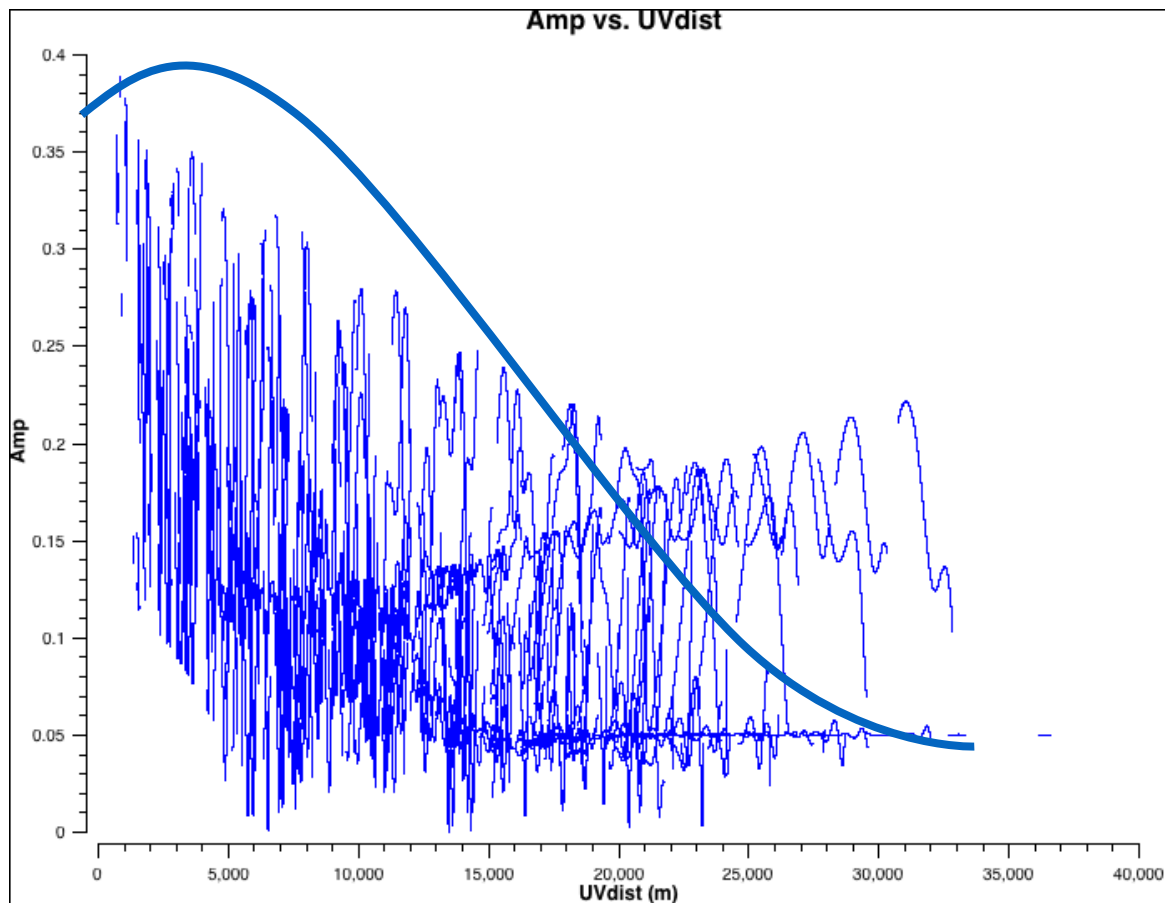
## WEIGHTING BY TELESCOPE

- Many arrays are heterogeneous e.g. e-MERLIN, EVN & AVN (when built)
- To get the best S/N need to increase weighting on larger telescopes so they contribute more.
- Nb. this can change the resolution depending on the baseline distribution.



# UV TAPERING

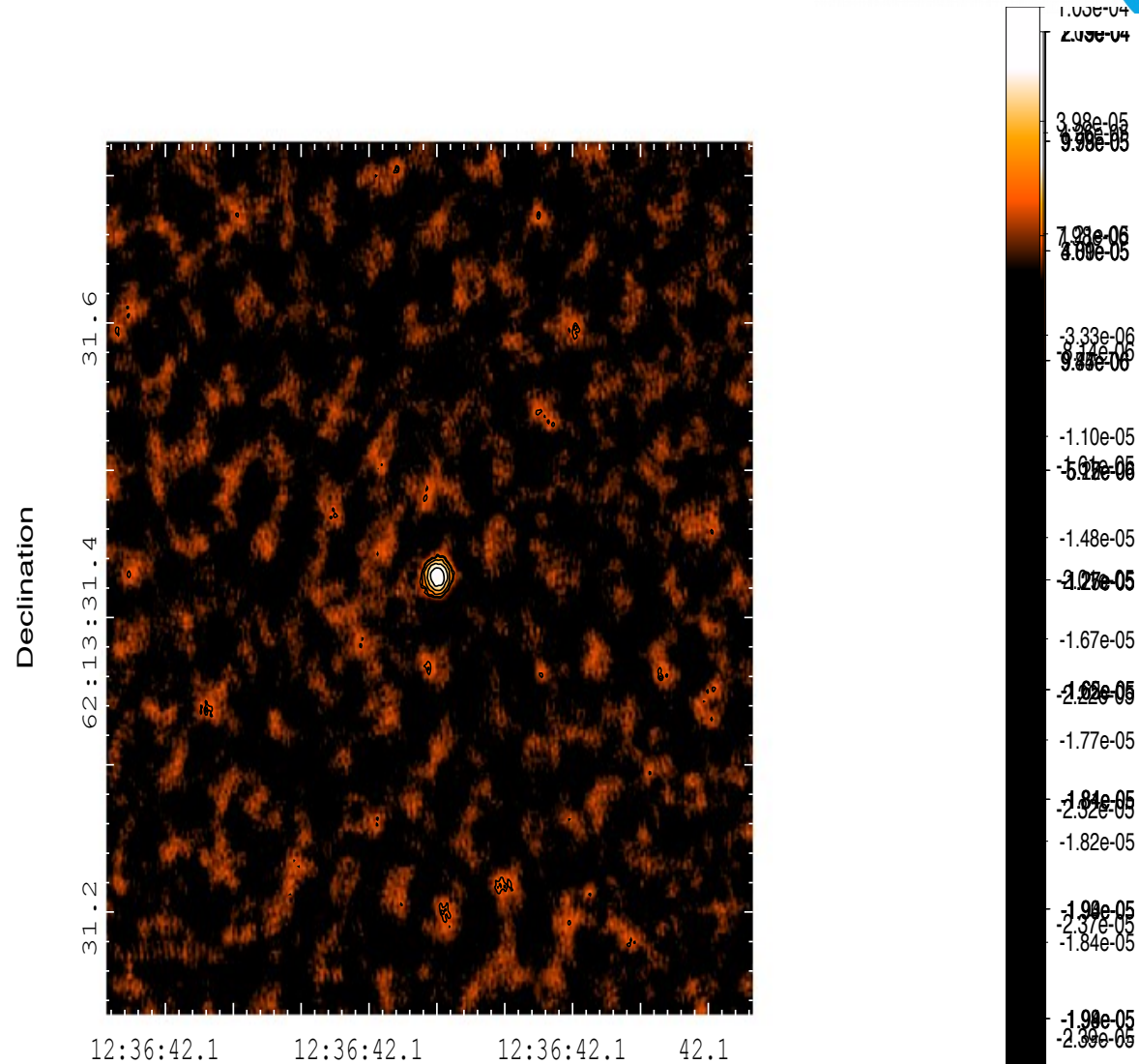
Gaussian u-v taper or u-v range can smooth the image but at the expense of sensitivity since data are excluded or data usage is non-optimal



Can compromise image quality in VLBI arrays by severely restricting the  $u$ - $v$  coverage

Controlled by the `uvtaper` parameter in CASA task `tclean/clean`

# UV TAPERING



### 3. WIDE-FIELD IMAGING

A 'wide-field' image is defined as:

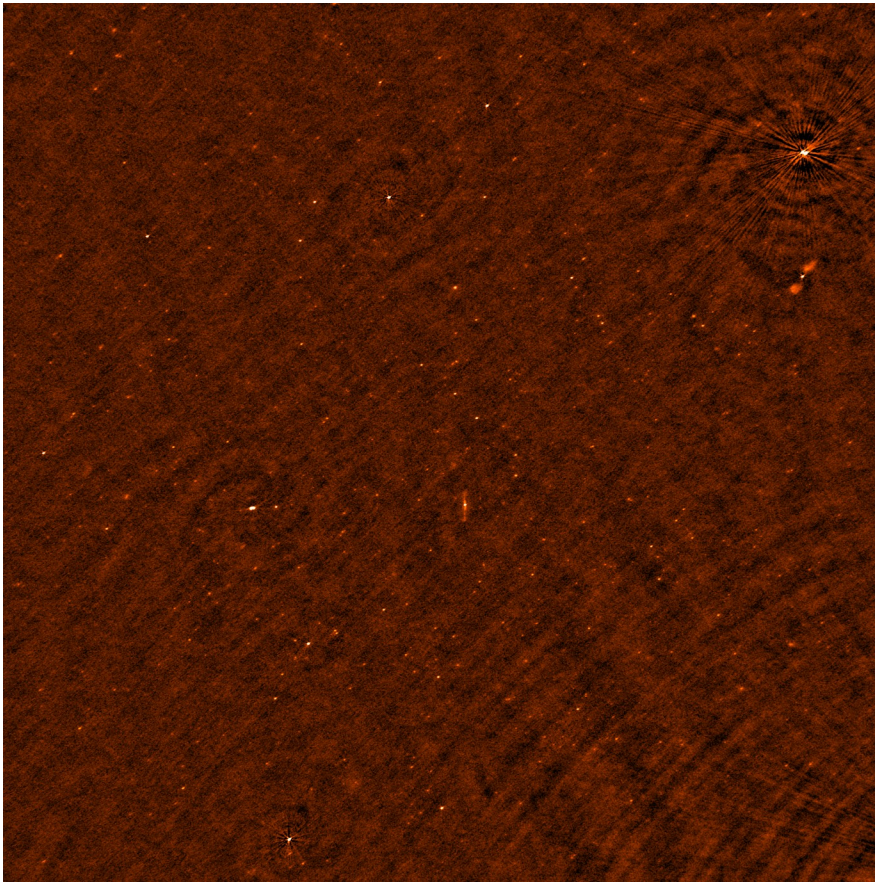
- An image with large numbers of resolution elements across them
- Or multiple images distributed across the interferometer primary beam

In order to image the entire primary beam you have to consider the following distorting effects:

1. Bandwidth smearing
2. Time smearing
3. Non-coplanar baselines (or the 'w' term) - Covered in advanced imaging



# CONFUSION



JVLA image of GOODS-N showing confusion from a 0.25Jy source to the SE

- Bright radio sources on the edge of the primary beam give rise to ripples in the centre of the field of view
- The primary beam is spectrally dependent, so image subtraction should include such corrections and be performed in full spectral-line mode
- Pointing errors introduce gain and phase changes on the edge of the primary beam. If severe, the apparent source structure may change – attempt multiple snapshot subtraction on timescales comparable with pointing error change



So how do we deal with these sources?

1. Outlier fields (the CASA default option) - deconvolve the confusing source while imaging the field of interest
2. Peeling - self-cal. on confusing source (to remove phase errors), get model & subtract source. Return to original calibration & insert model into visibilities
3. Direction-dependent calibration - see Advanced Imaging lecture

These are listed in order of complexity - note that direction dependent calibration is not available for all telescope arrays

# CONFUSION

## 1. Outlier fields

If the source is out of your desired target area, then you can set a small area around the confusing source and deconvolve with the main image.

In CASA, this is achieved by setting multiple images (see right) or set an outlier file (orange box & example below)

```
# clean :: Invert and deconvolve images with selected algorithm
vis          = 'JVLA_combined_GOODSN.ms' # Name of input visibility file
imagename    = ['main', 'outlier'] # Pre-name of output images
outlierfile  = '' # Text file with image names, sizes, centers for outliers
field        = '' # Field Name or ID
spw          = '' # Spectral windows e.g. '0~3', '' is all
selectdata   = True # Other data selection parameters
timerange    = '' # Range of time to select from data
uvrange      = '' # Select data within uvrange
antenna      = '' # Select data based on antenna/baseline
scan         = '' # Scan number range
observation   = '' # Observation ID range
intent       = '' # Scan Intent(s)

mode         = 'mfs' # Spectral gridding type (mfs, channel, velocity, frequency)
nterms       = 1 # Number of Taylor coefficients to model the sky
reffreq      = '' # Reference frequency (nterms > 1), '' uses central data-frequency

gridmode     = '' # Gridding kernel for FFT-based transforms, default='None'
niter        = 500 # Maximum number of iterations
gain         = 0.1 # Loop gain for cleaning
threshold    = '0.0mJy' # Flux level to stop cleaning, must include units: '1.0mJy'
psfmode      = 'clark' # Method of PSF calculation to use during minor cycles
imagermode   = 'csclean' # Options: 'csclean' or 'mosaic', '', uses psfmode
cyclefactor  = 1.5 # Controls how often major cycles are done. (e.g. 5 for frequently)
cyclespeedup = -1 # Cycle threshold doubles in this number of iterations

multiscale   = [] # Deconvolution scales (pixels); [] = standard clean
interactive  = False # Use interactive clean (with GUI viewer)
mask         = [] # Cleanbox(es), mask image(s), region(s), or a level
imsize      = [[8000, 8000], [50, 50]] # x and y image size in pixels. Single value: same for both
cell         = ['0.33arcsec'] # x and y cell size(s). Default unit arcsec.
phasecenter  = ['J2000 12h36m49.4 62d12m58.0', 'J2000 12h34m52.2 62d02m34.53'] # Image
```

#content of outliers.txt

#

#outlier field1

imagename='outlier1'

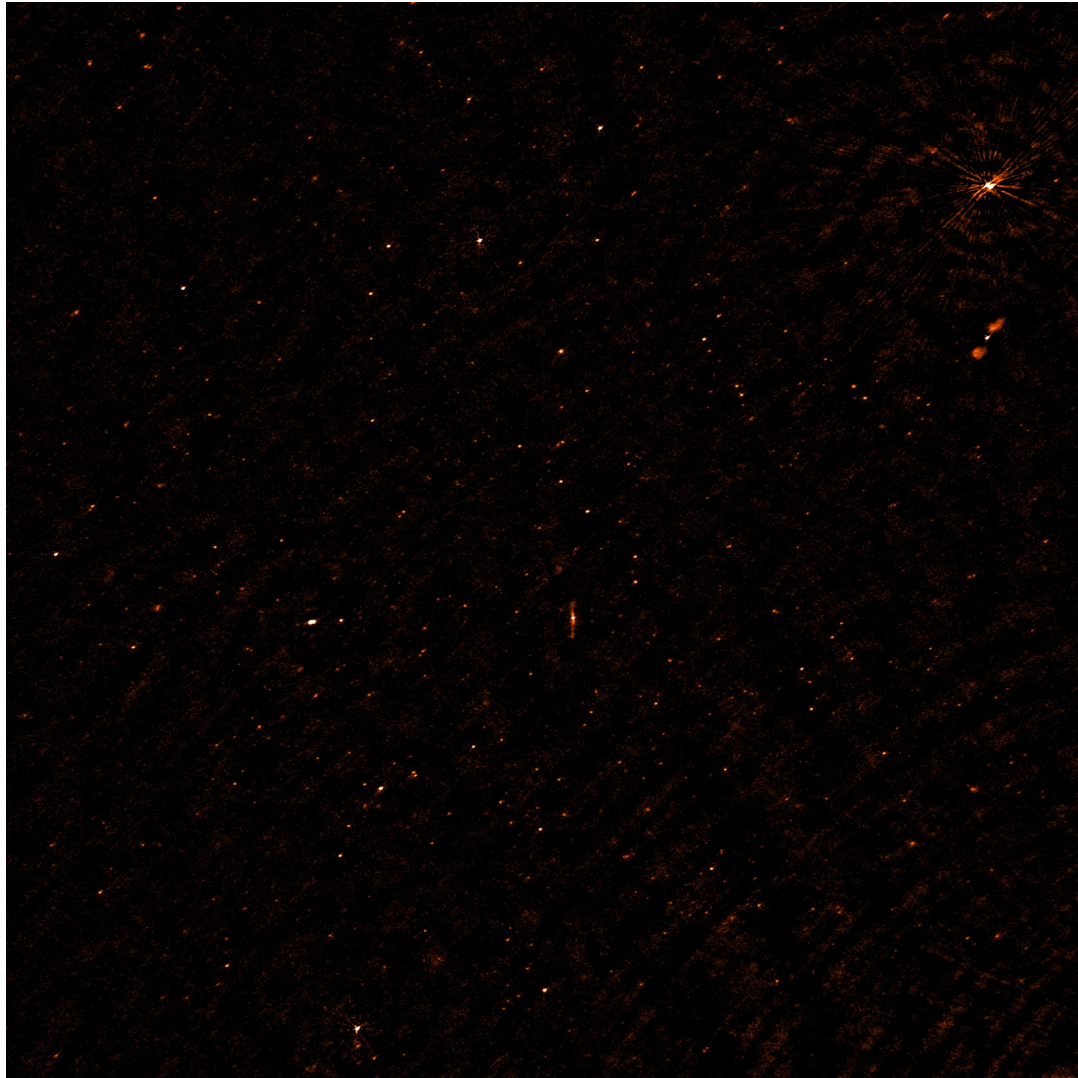
imsize=[512,512]

phasecenter = 'J2000 12h34m52.2 62d02m34.53'

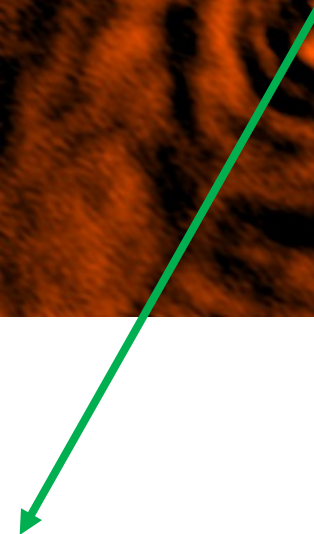
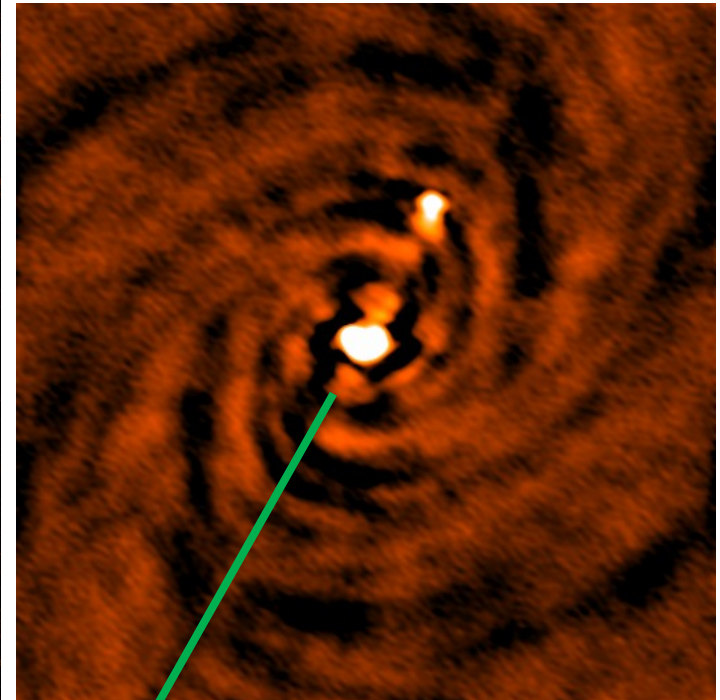
mask='box[[245pix,245pix],[265pix,265pix]]'

# CONFUSION

## 1. Outlier fields



0.25 Jy confusing source using  
outlier field assigned

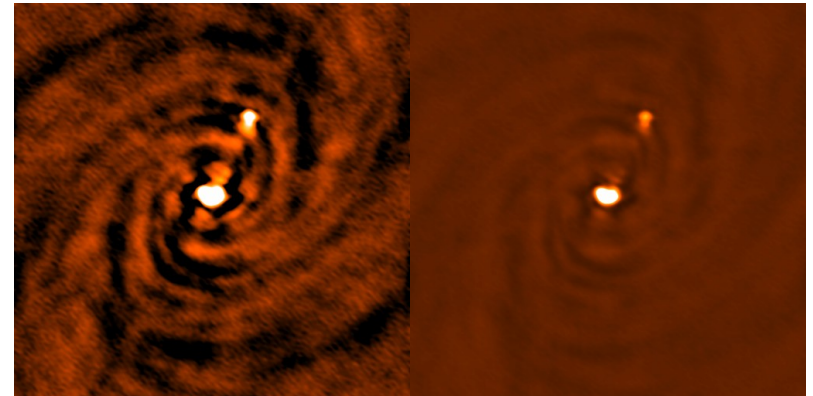
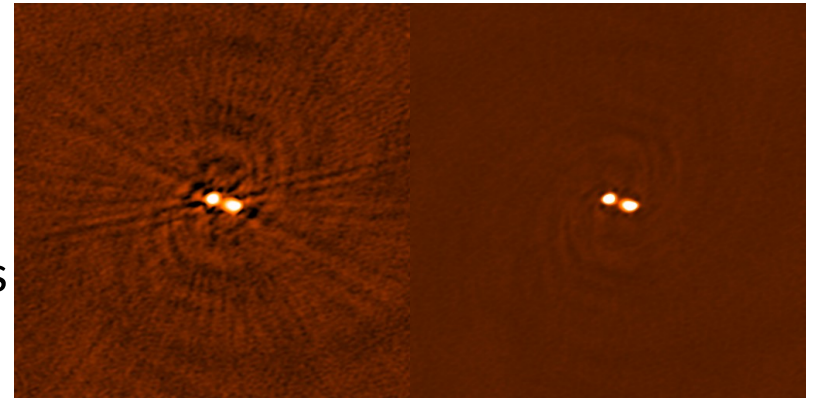




# CONFUSION

## 2. Peeling If outlier fields do not work try peeling!

- After phase calibrating the data, perform self-calibration for the brightest confusing source – then subtract it out
- Delete phase solutions derived for previous confusing source (1)
- Move to next brightest confusing source, perform self-calibration/imaging cycles – then subtract that source from the dataset (2)
- Perform (1) and (2) until all confusing sources are subtracted. Delete all self-calibration solutions and image central regions

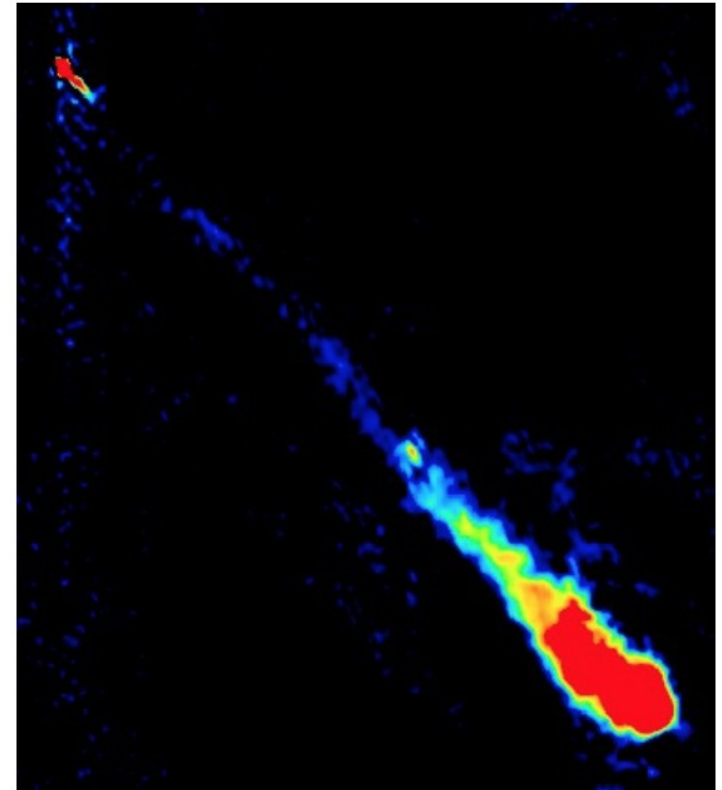


Before

After

## HIGH DYNAMIC RANGE IMAGING

- Present dynamic range limits (on axis):
  - Phase calibration – up to 1000:1 !  
improve with self-calibration
  - Non-closing data errors – continuum  
~20,000:1, line >100,000:1
  - After non-closing error correction  
~10,000,000:1
- Non-closing errors thought to be dominated by small changes in telescope passbands.
- Spectral line data configurations are the default for all new wide-band radio telescopes.
- In order to subtract out confusion we will need to be able to image with these very high dynamic ranges away from the beam centre



3C273, Davis et al. (MERLIN)  
1,000,000:1 peak – RMS



# SIGNAL TO NOISE



Noise level of a (perfect) homogeneous interferometer:

$$\text{Noise} = \frac{\sqrt{2}k_B T_{\text{sys}}}{\sqrt{n_b t \Delta\nu A \eta}}$$

where:  $T_{\text{sys}}$  - system temperature [K]  
 $n_b$  - number of baselines  
 $t$  - integration time [s]  
 $\Delta\nu$  - bandwidth [Hz]  
 $A$  - area of apertures [m]  
 $\eta$  - aperture efficiency

Many factors increase noise level above this value:

- Confusion
- Calibration errors
- Bad data
- Non-closing data errors
- Deconvolution artefacts

**Rarely** get this from an image. Dependent of flagging accuracy, calibration & adequate deconvolution

But techniques presented in this workshop can get you closer!

# CONCLUSION



- interferometry samples Fourier components of sky brightness
- make an image by Fourier transforming sampled visibilities
- deconvolution attempts to correct for incomplete sampling
- remember
  - there are an infinite number of images compatible with the visibilities
  - missing (or corrupted) visibilities affect the entire image
- astronomers must use judgement in the imaging and deconvolution process
- it's fun and worth the trouble → high angular resolution images!

*many, many issues not covered in this talk: see References and upcoming talks*