# Introduction to imaging

D2

Cristiana Spingola (INAF Istituto di Radioastronomia) Katharine Johnston (University of Leeds) Jack Radcliffe (University of Pretoria/University of Manchester)

> Strongly based on <u>previous ERIS schools</u> Thanks to previous lecturers!

#adv conference: save the date

## Bologna VLBI: Life begins at 40! New frontiers and scientific challenges with enhanced frequency/time/space dynamic range

40th anniversary of the start of VLBI operations in Italy

## 22-26 May 2023 – Bologna, Italy

If you are interested, start booking the hotel now! For further info contact me spingola@ira.inaf.it

#### Before starting

https://www.jb.man.ac.uk/DARA/ERIS22/imaging.html

You should download

ERIS22\_imaging\_tutorial.tar.gz

In the folder you are working now, you should have

- 1252+5634.ms measurement set with visibilities of the target
- 3C277.1\_imaging\_outline2022.py script that we will use now
- 3C277.1\_imaging\_all2022.py script with spoilers!

## Imaging 101

https://www.jb.man.ac.uk/DARA/ERIS22/imaging.html#imaging101

#### Imaging 101: intro

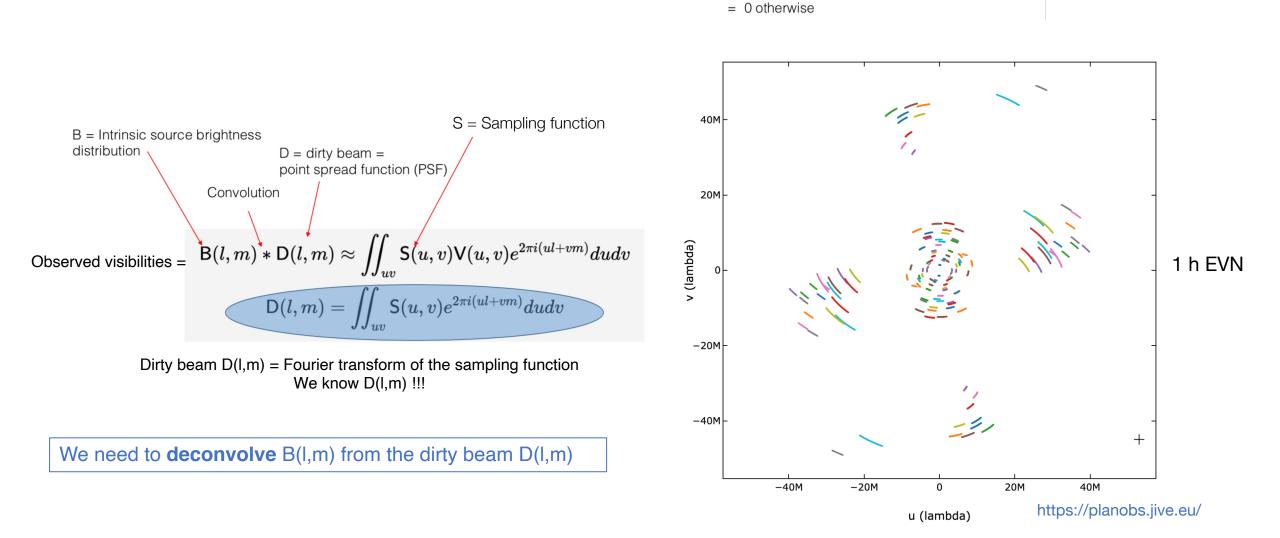
The output of an interferometer is basically a table of the correlation (amp. & phase) measured on each baseline every few seconds.

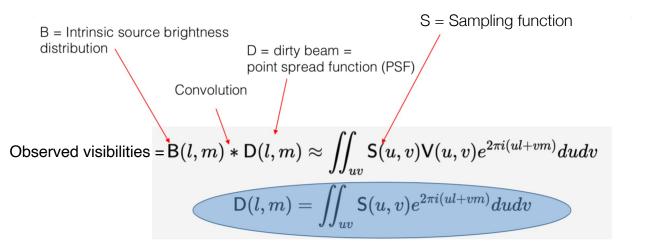
To get the final image out of our visibilities the steps are:

Calibration and data editing **Deconvolution (making a CLEANed image)** Refining calibration (self-cal) Final self-calibrated image

S = sampling function

= 1 where there is a measurement in the uv plane

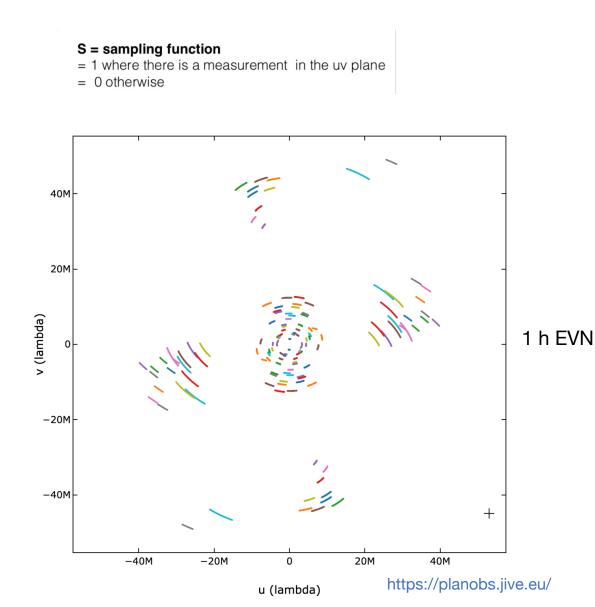


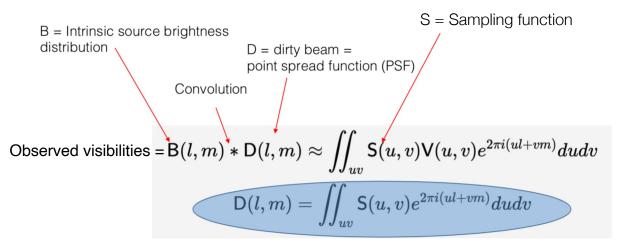


An ideal interferometer would deliver on a regularly highly sampled rectangular grid. An image of would then be made by simply applying a Fourier transform

## But, arrays provide (poorly) sampled Fourier Transform of the radio brightness region of sky

You need as many V(u,v) points as possible to reconstruct as robustly as possible the surface brightness distribution of the source





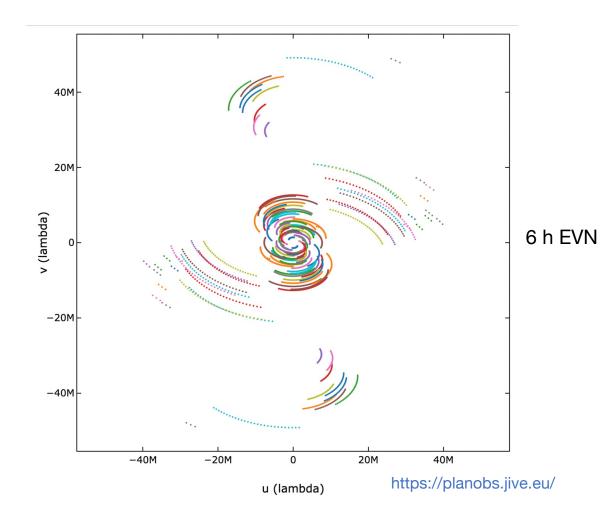
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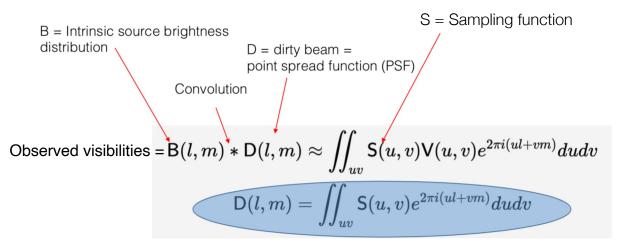
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- = 1 where there is a measurement in the uv plane
- = 0 otherwise

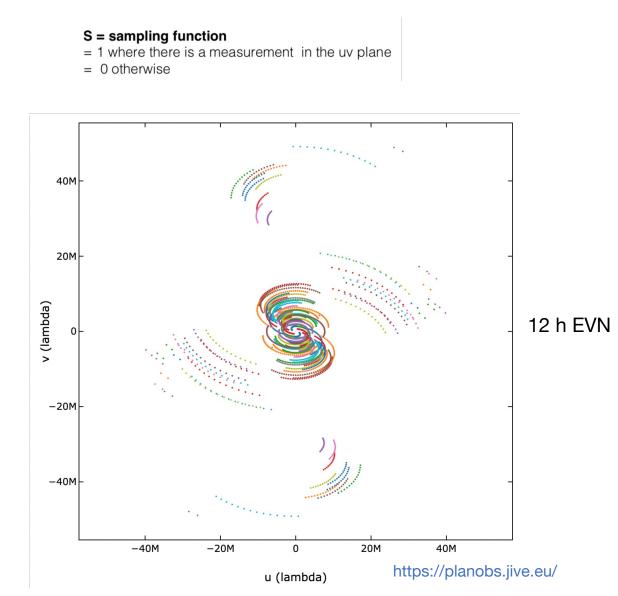


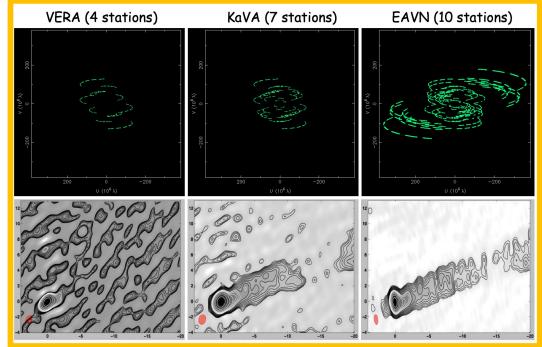


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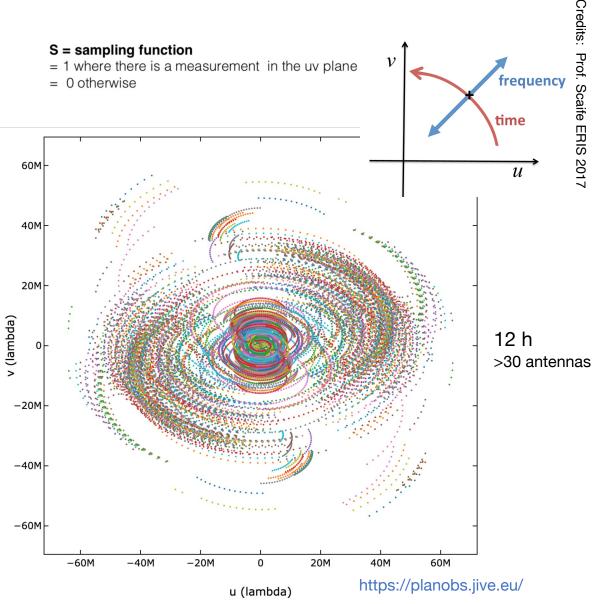


**Credits: Prof. Kazuhiro Hada** 

An ideal interferometer = measurements on a regularly highly sampled rectangular grid. An image of would then be made by simply applying a Fourier transform

#### But, arrays provide (poorly) sampled Fourier Transform of the radio brightness region of sky

You need as many V(u,v) points as possible to reconstruct as robustly as possible the surface brightness distribution of the source



#### Imaging 101: Gridding

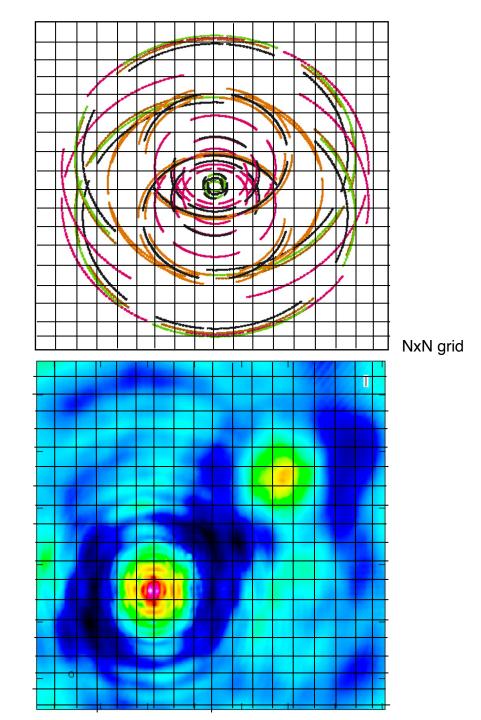
#### But, arrays provide (poorly) sampled Fourier Transform of the radio brightness region of sky AND There will always be gaps in the u-v plane!

Two approaches

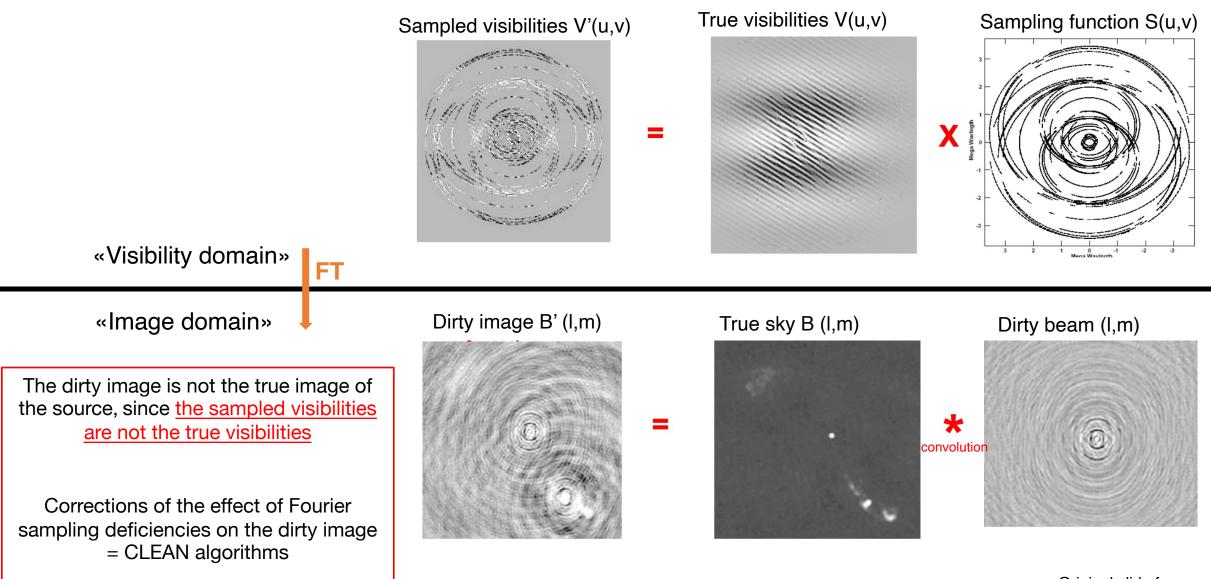
Direct Fourier Transform (DFT) = FT evaluated at every point of a rectangular grid –  $O(N^2)$  operations impractical for large number of visibilities

**Fast Fourier Transform (FFT)** = interpolate the data onto a rectangular grid – O(N log N) operations It saves a lot of computing time!!

This FFT method requires the observed visibilities to be interpolated on a regular grid Usually we define the grid in the image plane, where grid spacing = cell size

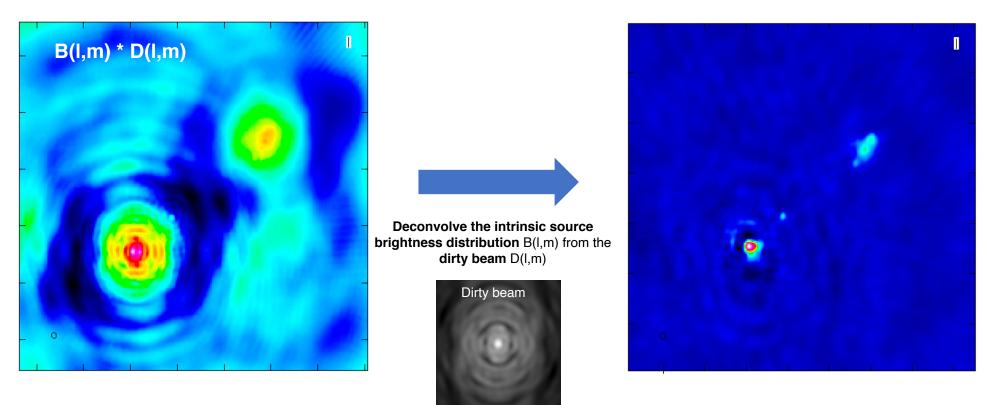


#### Imaging 101: the need for deconvolution



Original slide from Prof. Garrington ERIS 2017

....Why do we need all of this again?

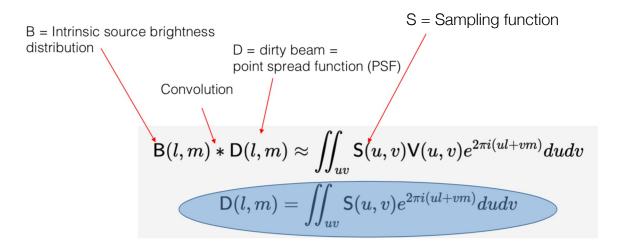


From «dirty image»

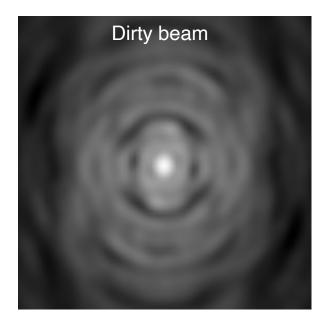
To «CLEAN image»

Since only a finite number of (noisy) samples are measured, to recover B(l,m) we need **some stable non-linear approach** + *a priori* information:

- B(I,m) must be positive
- Radio sources do not resemble the dirty beam (i.e. sidelobes-like patterns)
- Sky is basically empty with just a few localised sources



We know this! To recover B we have "just" to deconvolve the D(I,m) term



CLEAN method principal steps (Clark's algorithm):

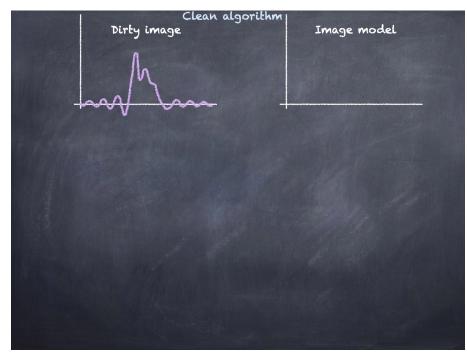
#### 1) Initialize a residual map (first image = dirty image)

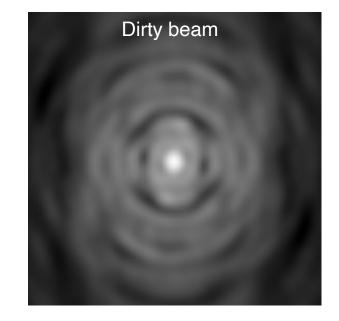
2) Identify strongest peak as a delta component

3) Record the position and magnitude in a model (clean components), subtract it from the dirty image

4) Go to 1) unless you reach the stopping criterion

5) Convolve the model (clean components) with an idealized CLEAN beam (elliptical Gaussian fit of the main lobe of the dirty beam)





CLEAN method principal steps (Clark's algorithm):

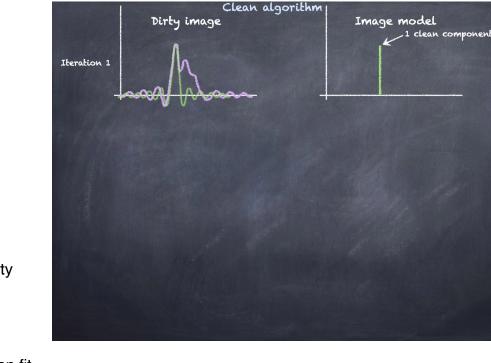
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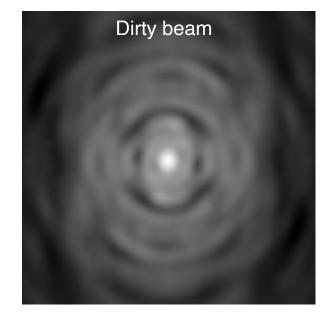
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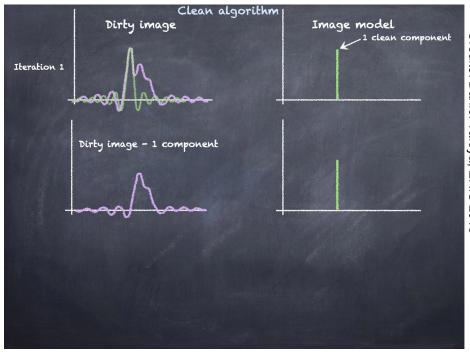
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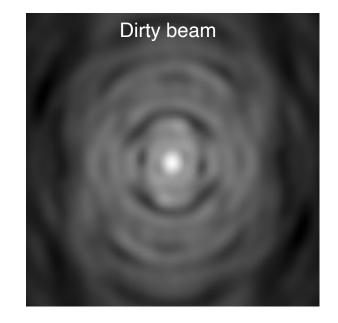
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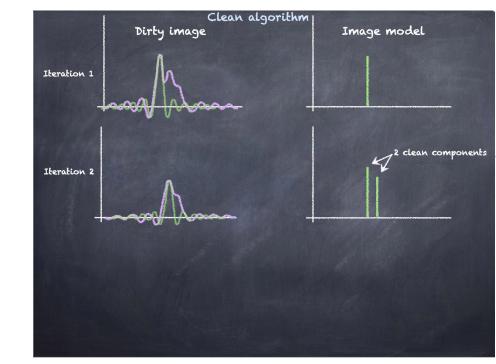
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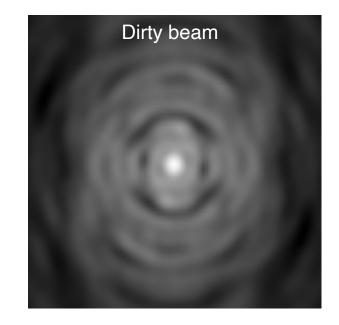
5) Convolve the model (clean components) with an idealized CLEAN beam (elliptical Gaussian fit of the main lobe of the dirty beam)

6) Add the residual of the dirty image to the CLEAN image



Credits: Daniel Tafoya,

**ERIS 2019** 



CLEAN method principal steps (Clark's algorithm):

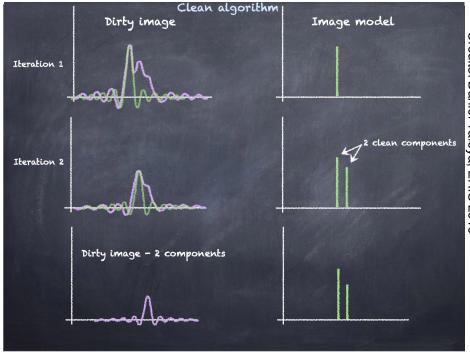
#### 1) Initialize a residual map (data - model)

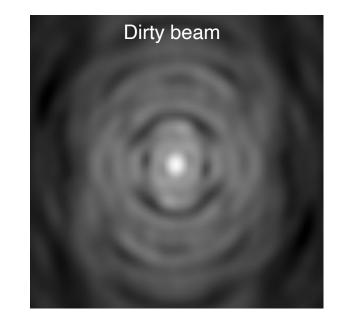
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# Credits: Daniel Tafoya, ERIS 2019

### Imaging 101: Deconvolution

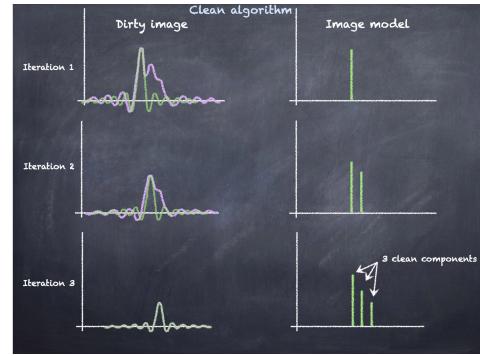
CLEAN method principal steps (Clark's algorithm):

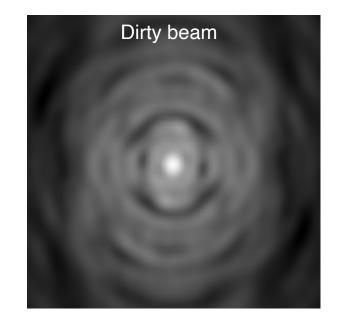
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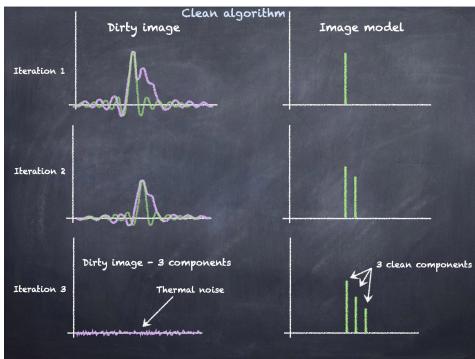
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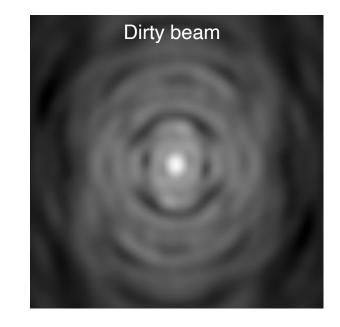
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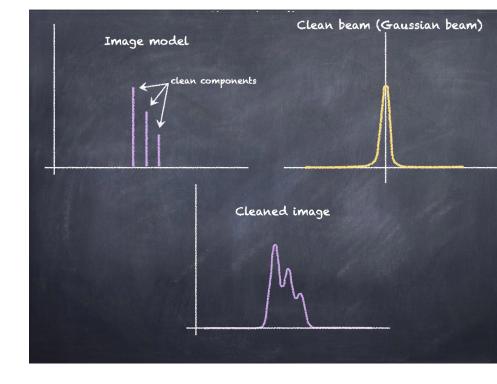
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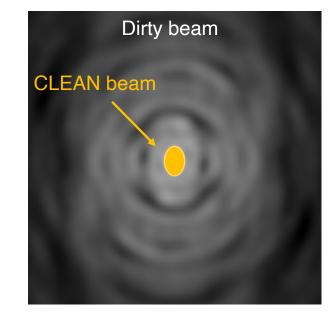
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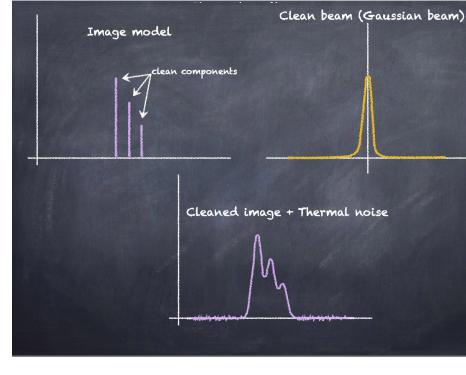
CLEAN method principal steps (Clark's algorithm):

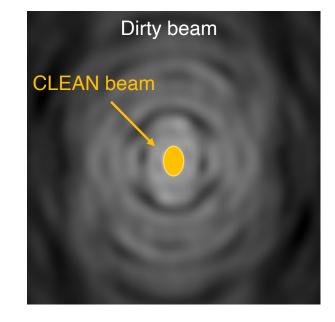
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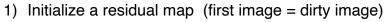
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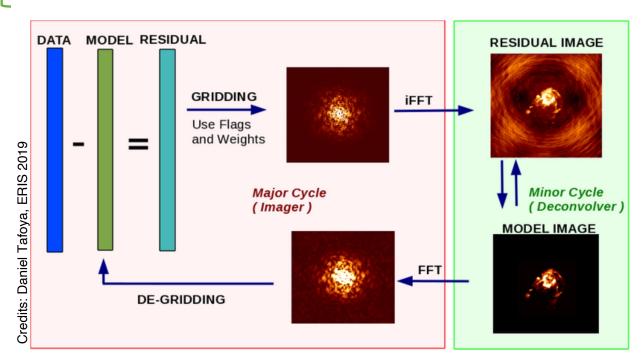
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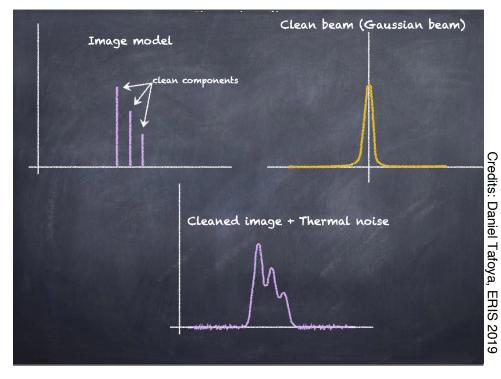


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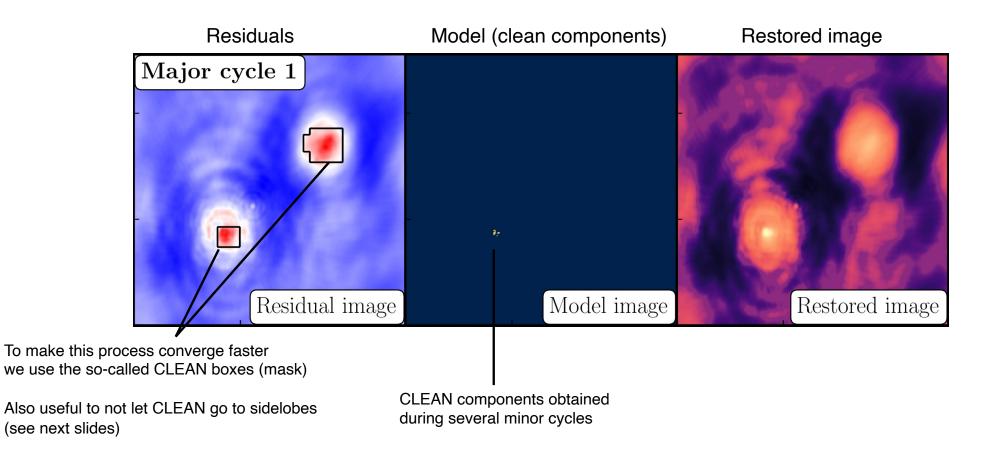


#### The major cycle implements FT between the data and image domains

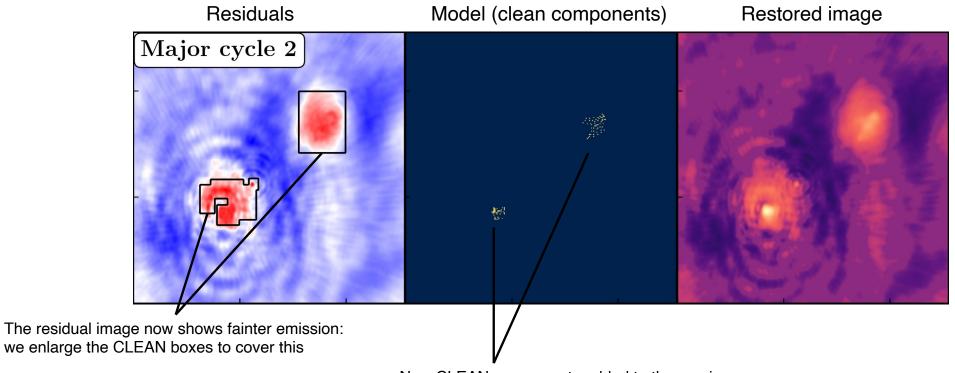
The minor cycle operates purely in the image domain

(The 2-cycles approach makes the deconvolution faster)

CLEAN in action

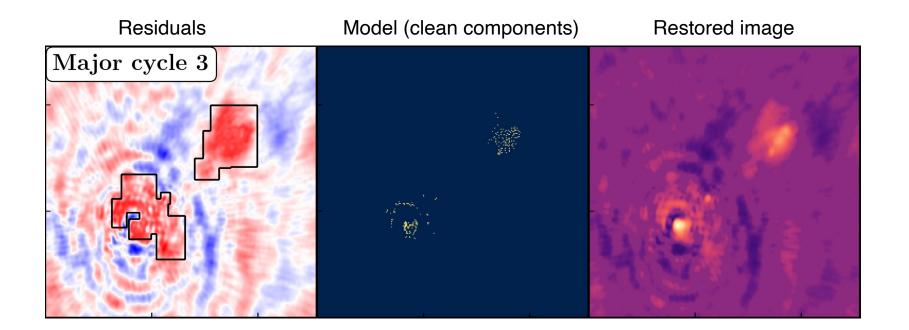


CLEAN in action

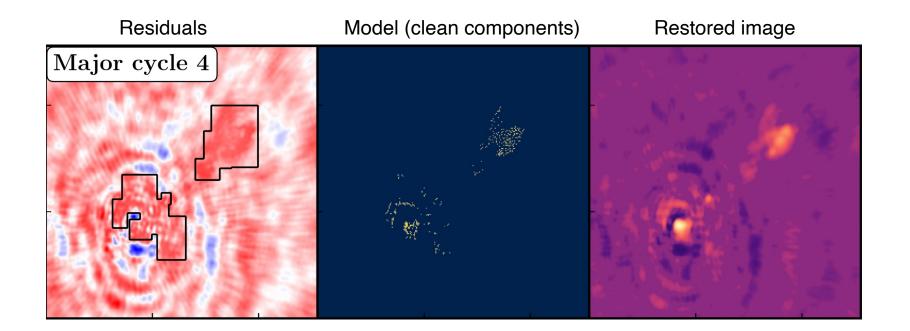


New CLEAN components added to the previous ones

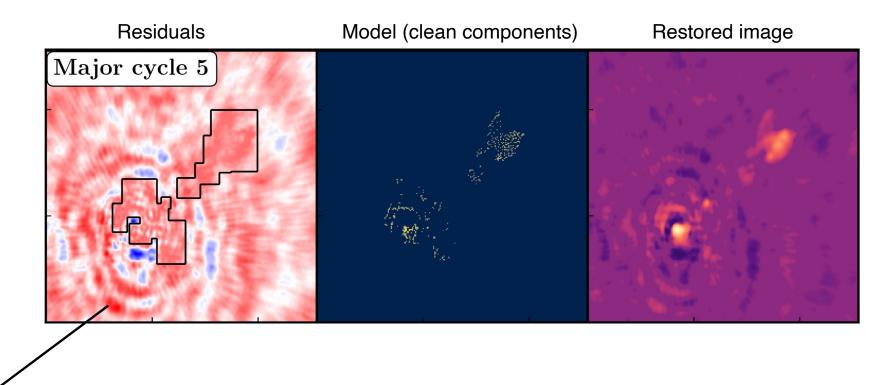
CLEAN in action



CLEAN in action

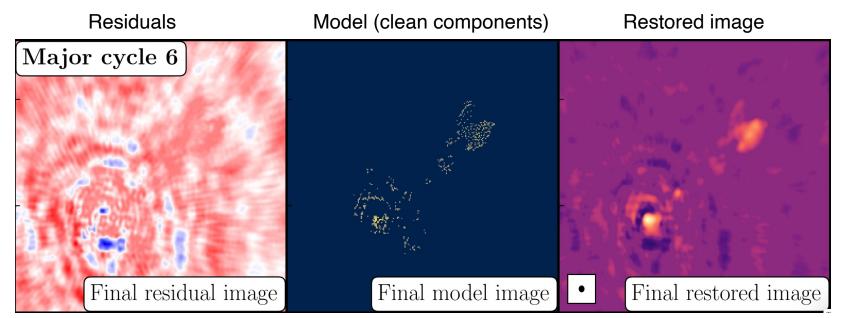


CLEAN in action



This emission is brighter BUT it's due to sidelobes! It's always a good idea take a look at the dirty beam before starting cleaning + CLEAN boxes prevent the CLEANing of sidelobes

CLEAN in action



Residual image should look like «only noise»

#### Imaging 101: CLEANing stopping criteria

• Visually, when your residuals contain only noise – this means that you cleaned all the flux density of the source

• **Convergence**: Check the logger for max-min (possibily symmetrical), total flux density should increase while cleaning (if not, stop), noise level should decrese (if it does not change anymore, stop  $\rightarrow$  overcleaning)

• **Negative peak identified** (negatives can indicate that CLEAN is now working on sidelobes/noise, but it can also indicate that CLEAN is trying to fix earlier mistakes)

• Smallest peak identified below a threshold – which can be noise-based (e.g. 3 x theoretical noise estimated with exposure calculator)

•Number of iterations (not the best criterion, as you may end up doing too much or too little cleaning)

#### CLEANING-related

- Interpolation of unsampled (u,v) spacings (in particular short spacings) : reconstruction of largest spatial scales is always an extrapolation (CLEAN boxes help)
- Assumption of point-sources for extended structure is not great (see Radcliffe's lecture tomorrow on imaging!)
- Under- and over-cleaning are often an issue (over-cleaning: rms in logger does not change anymore)
- **Computationally expensive**, as it requires iterative, non-linear fitting process (CLEAN boxes help this too)

#### Calibration and data-handling related

- Bandwidth and time smearing
- Amplitude/phase errors from previous calibration and/or unflagged data (symmetric/antisymmetric artefacts)

Source-related

- Variability of the source
- Spectral variations of the source multi frequency synthesis (gridding different frequencies on the same (u,v) grid is now standard) see Radcliffe's lecture tomorrow on imaging!



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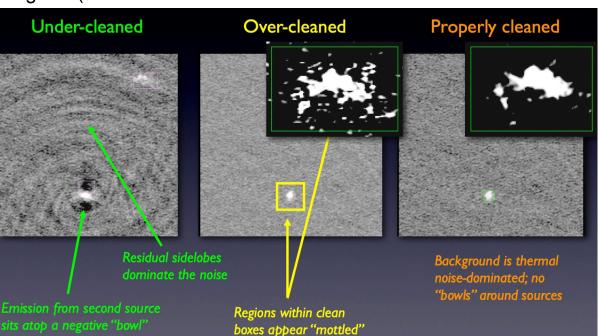
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**Credits: Michael Wise UVA lectures** 

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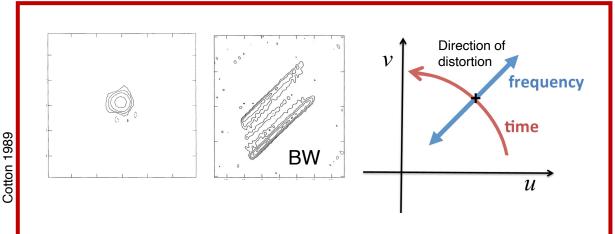
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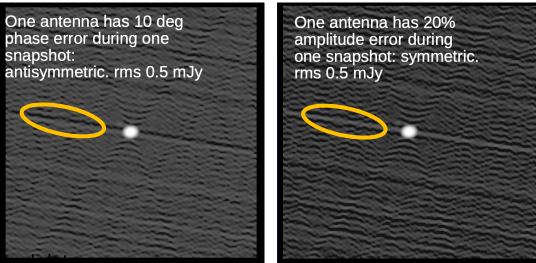
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Credits: Laing ERIS 2013

#### **CLEANING-related**

Interpolation of **unsampled (u,v) spacings** (in particular short spacings) : reconstruction of largest spatial scales is always an extrapolation (CLEAN boxes help)



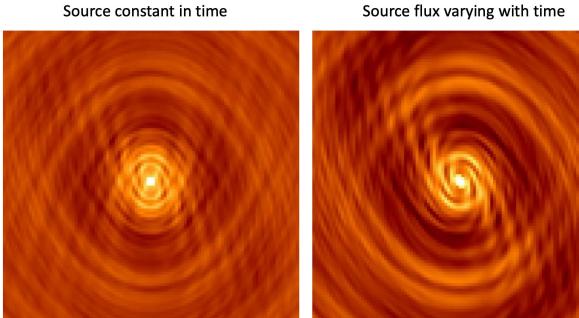
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#### Calibration and data-handling related

- Bandwidth and time smearing
- Amplitude/phase errors from previous calibration an (symmetric/antisymmetric artefacts)

Source-related

Variability of the source



**Spectral variations of the source** – multi frequency synthesis (gridding different frequencies on the same (u,v) grid is now standard) see Radcliffe's lecture tomorrow on imaging!

### Imaging 101: CLEANing issues and recognizing errors

#### CLEANING-related

 Interpolation of unsampled (u,v) spacings (in particular short spacings) : reconstruction of largest spatial scales is always an extrapolation (CLEAN boxes help)

Vwave vs. Uwave

6.000

4,000

2,000

-2.000

-4,000

-6,000

-6 000

-4 000

-2.000

Uwave

2.000

4 000

6 000

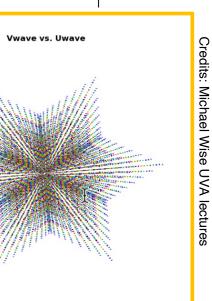
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Source-related

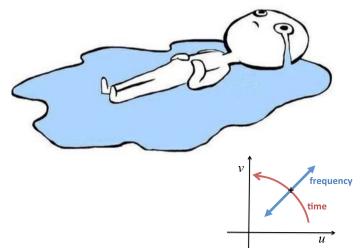
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2.000

4 000

6 000



6,000

4.000

2.000

-2.000

-4 000

-6.000

-6 000

-4 000

-2.000

Uwave

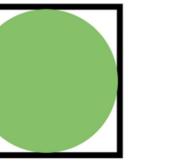
## **Determining imaging parameters**

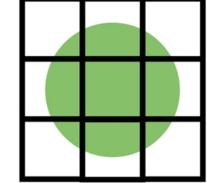
https://www.jb.man.ac.uk/DARA/ERIS22/imaging.html#determining

#### Imaging parameters: pixel size

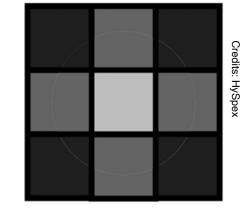
Nyquist sampling theorem in astronomical terms The FWHM of the PSF should be sampled by at least two pixels



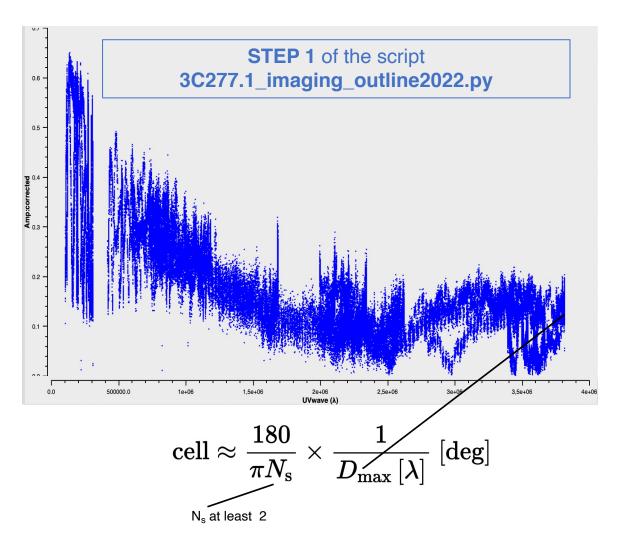




Output pixels (image)



Nyquist sampling theorem in **radioastronomical** terms

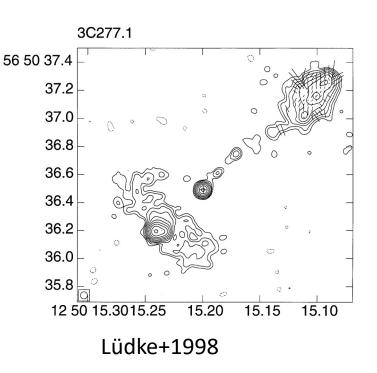


#### Imaging parameters: field of view and image size

The source size is typically much smaller than the entire Field-of-View (FoV), which corresponds approximately to the single-dish beam  $\approx \lambda/D$  (homogeneous array)

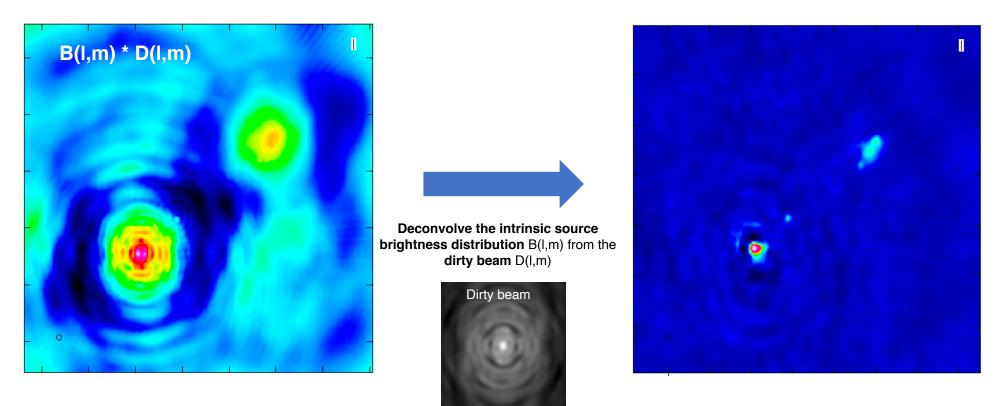
But it is also limited by time and bandwidth smearing: a typical FoV for VLBI is of the order of a few arcseconds

Also: it's always good to check <u>what is already known about your target</u>! For 3C277.1 check Lüdke+1998 (MNRAS, 299, 467–478)



#### Let's create a CLEAN image of 3C277.1!

https://www.jb.man.ac.uk/DARA/ERIS22/imaging.html#first\_image



From dirty image

To CLEAN image

STEP 2 of the script 3C277.1\_imaging\_outline2022.py

# First image of 3C277.1

https://www.jb.man.ac.uk/DARA/ERIS22/imaging.html#first\_image

If you don't know what a parameter means, its units... just type help tclean

imagename field cell imsize deconvolver



imagename

this is up to you



Name of the field (source) that you would like to image









imagename

this is up to you



Name of the field (source) that you would like to image



Angular size of your pixel

imsize

deconvolver



imagename

this is up to you



Name of the field (source) that you would like to image



Angular size of your pixel



Size of image in pixels – typically power of two 2<sup>n</sup> (128x128, 256x256, 512x512 etc.)

# deconvolver





imagename

this is up to you



Name of the field (source) that you would like to image



Angular size of your pixel



Size of image in pixels – typically power of two 2<sup>n</sup> (128x128, 256x256, 512x512 etc.)

**deconvolver** CLEAN algorithm -- Clark's algorithm is fine for now!



imagename

this is up to you



Name of the field (source) that you would like to image



Angular size of your pixel



Size of image in pixels – typically power of two 2<sup>n</sup> (128x128, 256x256, 512x512 etc.)

**deconvolver** CLEAN algorithm -- Clark's algorithm is fine for now!

**niter** If = 0 computes the dirty image; if > 0 runs major and minor cycles (sub-parameter *'cycleniter*')

weighting

imagename

this is up to you



Name of the field (source) that you would like to image



Angular size of your pixel



Size of image in pixels – typically power of two 2<sup>n</sup> (128x128, 256x256, 512x512 etc.)

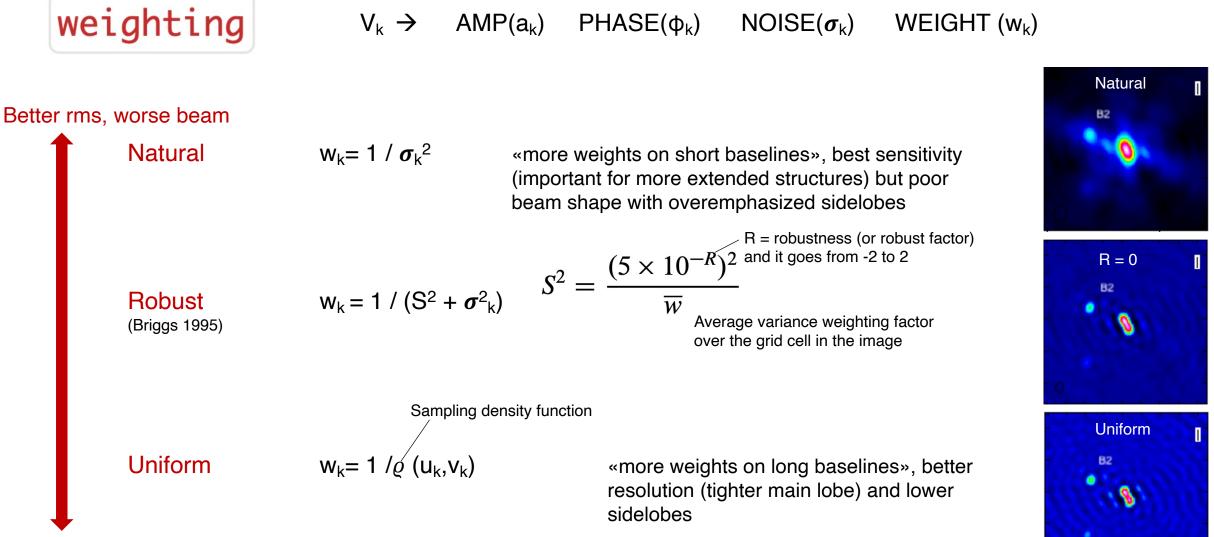
**deconvolver** CLEAN algorithm -- Clark's algorithm is fine for now!

**niter** If = 0 computes the dirty image; if > 0 runs major and minor cycles (sub-parameter *'cycleniter*')

weighting  $V_{obs}(I,m) = V_{true}(u,v) S(u,v)$ 

S(u,v) is 1 if there's a measurement and 0 elsewhere so-called **natural weights** 

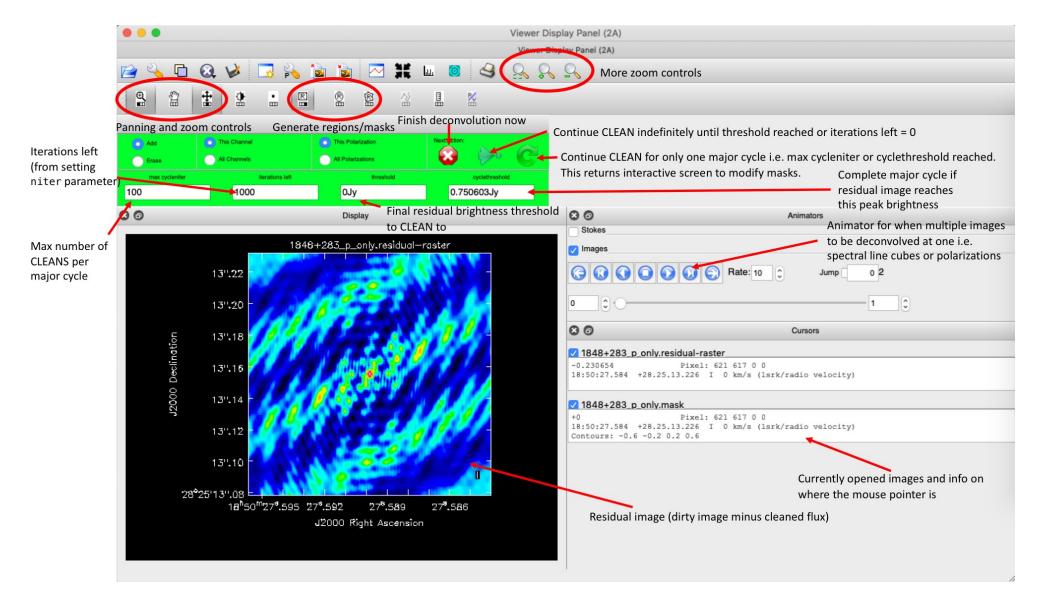
#### Imaging parameters in CASA: a slide about weights



Better beam, worse rms

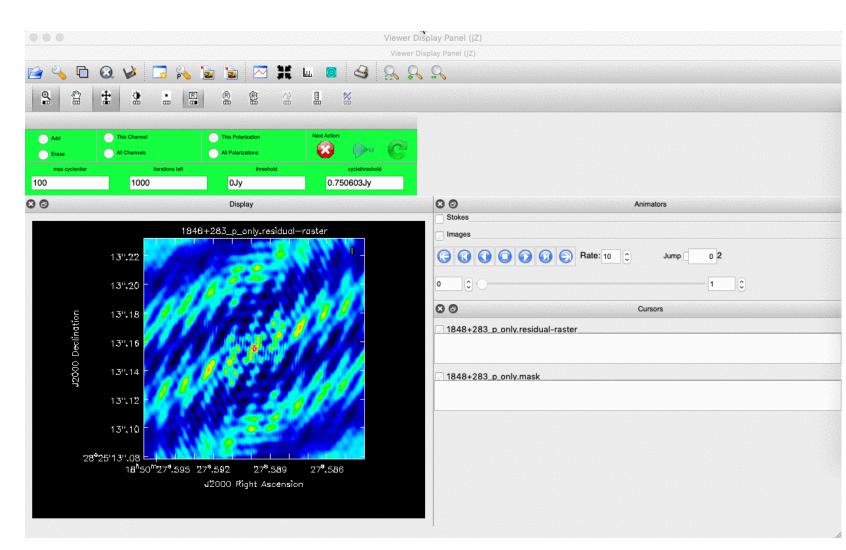
#### Imaging in CASA: interactive cleaning

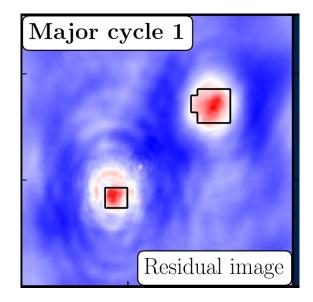
Once you are happy with the choice of parameters ... go tclean



### Imaging in CASA: interactive cleaning

#### Create the mask (CLEAN boxes)



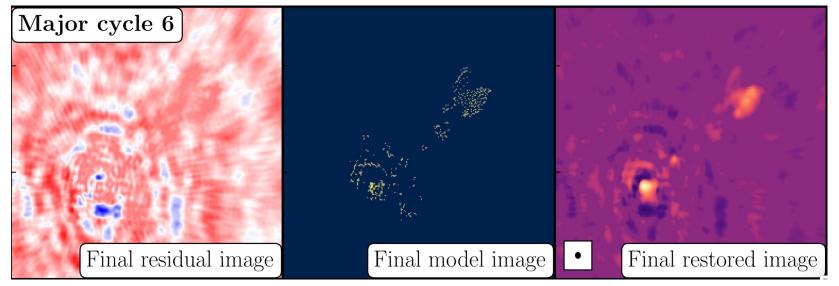


#### Put the boxes around the brightest emission first

It's an iterative process, you will be able to enlarge the boxes at later cycles

#### Imaging in CASA: interactive cleaning

Continue the cleaning process unitl your image looks like noise



ALWAYS take a look at the logger!

E.g., Flux density in the model should increase

- Major Cycle 1 model=0->0.177024
- Major Cycle 2 model=0.177024->0.381401,
- Major Cycle 3 model=0.381401->0.504565

If it keeps decreasing: STOP CLEANING!

model=0.686961->0.683864

### Imaging in CASA: output of tclean

.tt0, .tt1 ...  $\rightarrow$  Suffix to indicate Taylor terms for multi-term wideband imaging

.alpha and .alpha.error  $\rightarrow$  spectral index and its error map

.mask  $\rightarrow$  mask used (clean boxes)

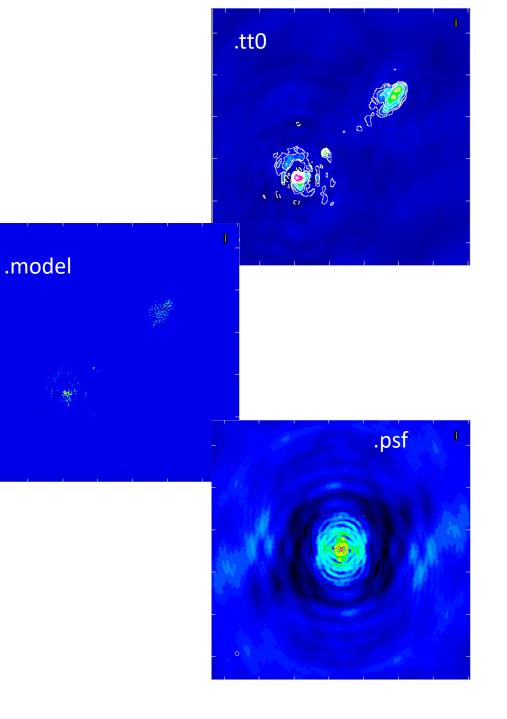
.psf (for tt0, tt1,...)  $\rightarrow$  dirty beam

.pb  $\rightarrow$  primary beam

**.residual**  $\rightarrow$  residual image (data – model)

**.sumwt**  $\rightarrow$  sum of the weights

Other details can be found here https://casa.nrao.edu/docs/taskref/tclean-task.html



## Measuring image properties

https://www.jb.man.ac.uk/DARA/ERIS22/imaging.html#image\_properties

#### Imaging in CASA: measuring image properties

https://www.jb.man.ac.uk/DARA/ERIS22/imaging.html#image\_properties

The peak s.b. is in Jy /beam

Task imstat While the integrated flux density is in **Jy** Step 3 of the script Region to get peak surface brightness and integrated flux density The rms of the image is in Jy / beam What is the dynamic range Example region (peak / off-source rms) for off-source of your image rms noise ???

#### Imaging in CASA: measuring image quality

- Off-source rms noise close to theoretical noise
- **Dynamic range** (peak / off-source rms) -- tipycal (good) values 10<sup>2</sup>- 10<sup>6</sup>
- **«Fidelity»** difference with an input model (need *a priori* info)
- Off-source rms noise structure quite uniform, close to a Gaussian random field («no stripes»): check for any phase and amplitude errors (see previous slides)

any «weird» structure might be a symptom that something went wrong (at the deconvolution stage and/or during calibration)

#### References

Chapters 7 and 8 of «Synthesis imaging in radio astronomy II» (Edited by Taylor Carilli and Perley)

Campbell 2019 http://old.evlbi.org/user\_guide/fov/fovSFXC.pdf

Interferometry and Synthesis in radio imaging (Thompson, Moran and Swenson) https://link.springer.com/book/10.1007/978-3-319-44431-4

Previous ERIS imaging lectures can be found here https://www.astron.nl/events/eris-2022/

Lecture on imaging by Michael Wise https://www.astron.nl/astrowiki/lib/exe/fetch.php?media=ra\_uva:ra\_uva\_lecture8.pdf

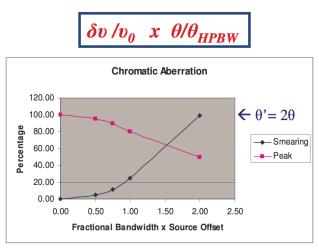
Images in the first slide: Spingola+2018, Giovannini+2018(NatAs), Boccardi+2016, Hartley+2019, McKean+2011, Giroletti+2020, Radcliffe+2016, Johnston+2020, Kellermann+2007

#### Extra slide: bandwidth and time smearing

#### Bandwidth smearing

•Bandwidth smearing (chromatic aberration) will produce radial smearing and reduction in source peak

•Parameterized by the product of the fractional bandwidth and the source offset in synthesised beamwidths



•Can be alleviated by observing and imaging in spectral line mode with many narrow frequency channels gridded separately prior to Fourier inversion – reduces  $\delta v$ 

•Detailed form of response depends on individual channel bandpass shapes.

#### Time smearing

•Time-average smearing (de-correlation) will produce tangential smearing

•In general cannot be easily parameterized. At Declination=+90° a simple case exists where the effects can be parameterized by the equivalent product:

$$\omega_e \delta t_{int} \ x \ \theta / \theta_{HPBW}$$

Where  $\omega_e$  is the Earth's angular rotation rate and  $\delta t_{int}$  is the integration time interval in the dataset

•For other Declinations the effects are more complicated. However they can be alleviated by ensuring that  $\delta t_{int}$  is small enough such that there at least 4 samples per turn assuming a maximum rate of  $\theta/\theta_{HPBW}$  turns in 6 hours