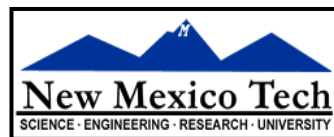


# Wide Band and Wide Field Imaging - II

Urvashi Rau, NRAO



Sixteenth Synthesis Imaging Workshop  
16-23 May 2018



# Measurement Equation

The visibility measured by each baseline  $ij$  at one frequency and time

$$V_{ij}^{obs}(\nu, t) = M_{ij}(\nu, t) S_{ij}(\nu, t) \iiint M_{ij}^s(l, m, \nu, t) I(l, m, \nu, t) e^{2\pi i (ul + vm + w(n-1))} dl dm dn$$

**Direction Independent Gains**

- Eliminated during calibration

**Primary Beams**

- Power pattern varies with time, frequency and baseline

- **PBcor (post-deconvolution)**
- **A-Projection**
- **WB-A-Projection**
- **Mosaics**

**Full Beam**

**Sky-brightness varies with frequency (time)**

- All sources have spectral structure (some vary with time)

- **Cube Imaging**
- **Multi-Frequency Synthesis (MFS)**
- **Multi-Term-MFS (point source or multi-scale models)**

**Wide-Band**

**W-Term**

- Non-coplanar baselines
- Sky curvature

- **Faceting**
- **W-Projection**
- **3D FT**
- **W-Stacking**

**Wide-Field**

Wide Band + Full Beam/Wide-field

+ Mosaics

+ Single Dish

Example : Imaging the G55 supernova remnant

Imaging Framework

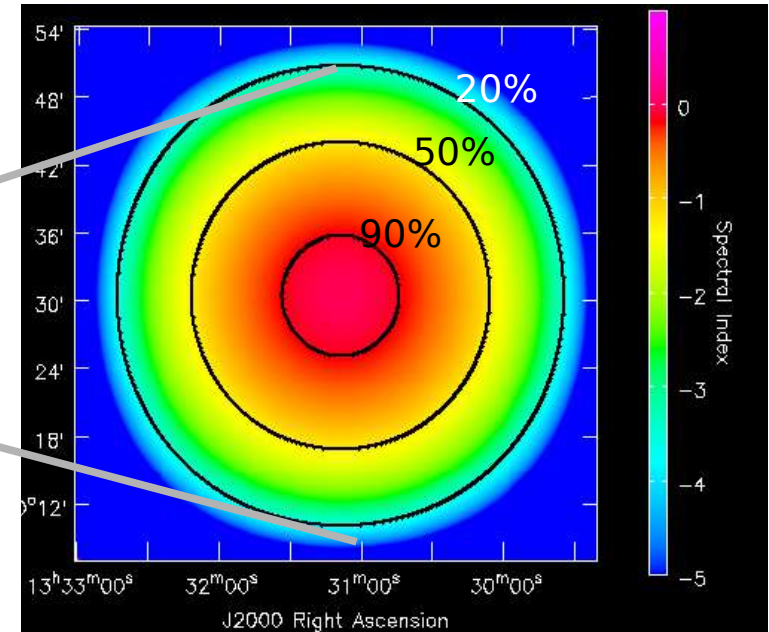
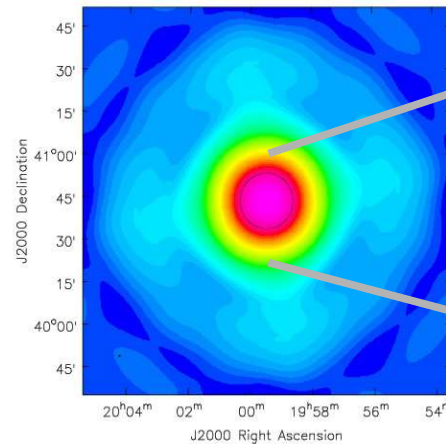
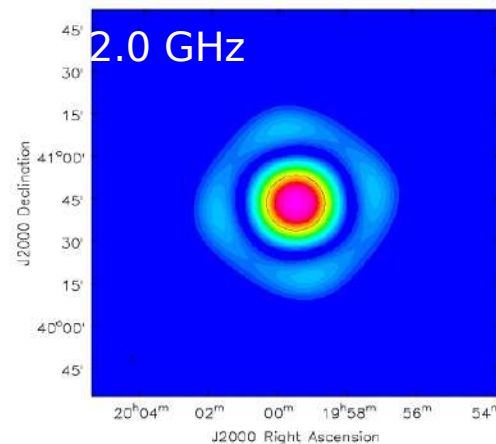
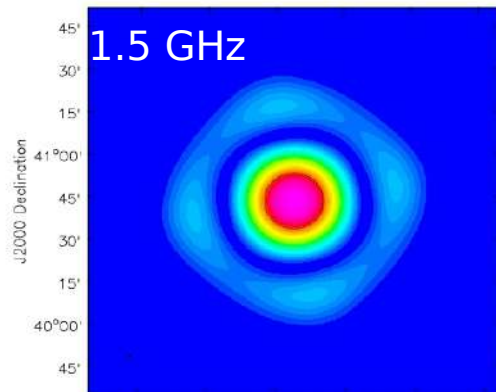
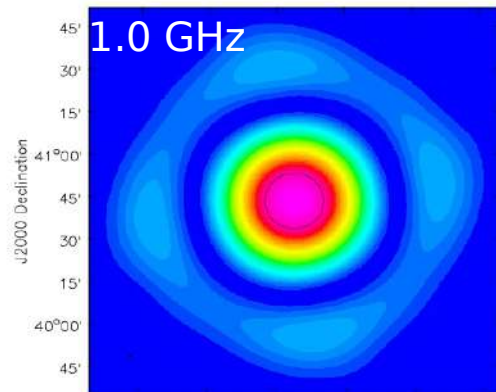
# Wide-Band Wide-Field Imaging : Primary Beams

## VLA PBs

Primary beam scales (or changes) with frequency

Spectral Index of PB

Average Primary Beam



A very wide shelf of sensitivity outside the main lobe

- For VLA L-Band (1-2 GHz)
- About -0.4 at the PB=0.8 (6 arcmin from the center)
  - About -1.4 at the HPBW (15 arcmin from the center)

$$I_{wf,wb}^{obs} = \sum_v \left[ \left( P_v \cdot I_v^{sky} \right) * PSF_v \right]$$

# Wide-Band Primary Beam Correction

## Cube Imaging

- Sky model represents  $I(\nu)P(\nu)$
- Divide the output image at each frequency by  $P(\nu)$

## Multi-Term MFS + Wideband-PBcor

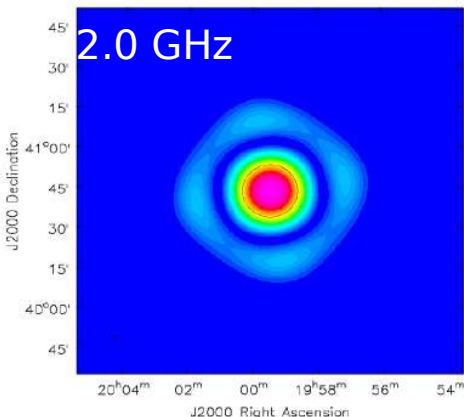
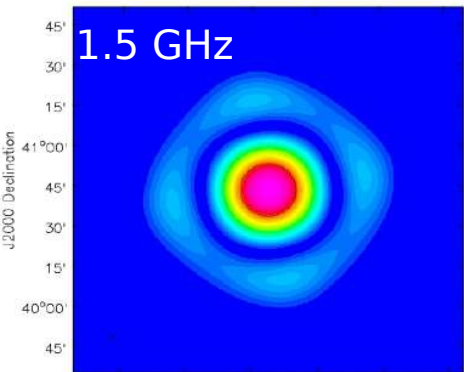
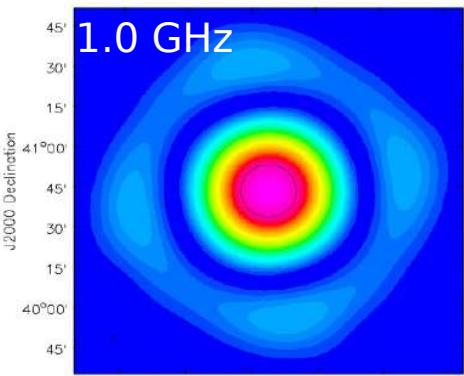
- Taylor coefficients represent  $I(\nu)P(\nu)$
- Polynomial division by PB Taylor coefficients 
$$\frac{(I_0^m, I_1^m, I_2^m, \dots)}{(P_0, P_1, P_2, \dots)} = (I_0^{sky}, I_1^{sky}, I_2^{sky}, \dots)$$

## Wideband A-Projection

- Remove  $P(\nu)$  during gridding (before model fitting)

$$A_{\nu}^{-1} \approx \frac{A_{\nu_c}^T}{A_{\nu_c}^T * A_{\nu}} \quad \text{where} \quad P_{\nu} \cdot P_{\nu_c} \approx P_{\nu_{mid}}^2$$

- Output spectral index image represents only the sky

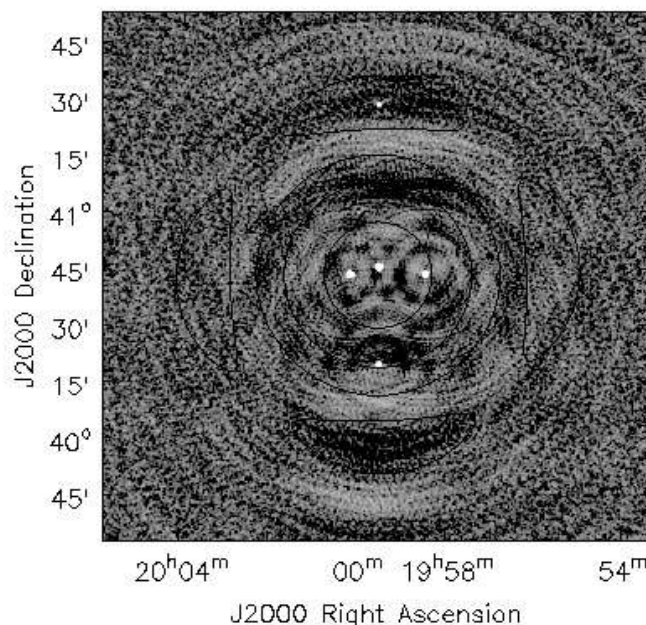




# Wide Band Full Beam imaging – Different algorithms

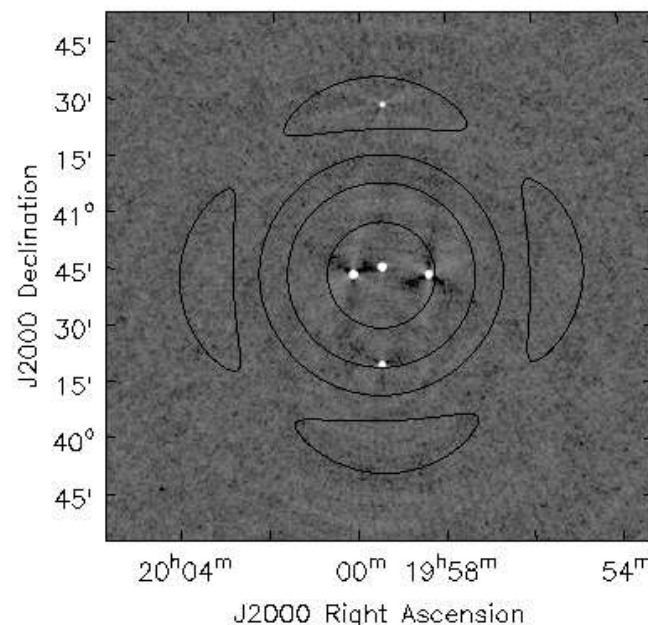
Basic  
MFS  
imaging

(no WB,WF  
corrections)



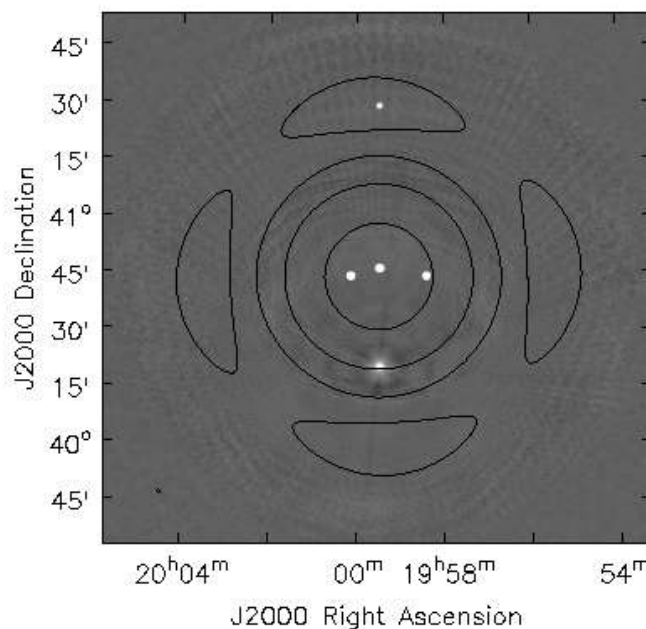
MT-MFS  
wideband  
imaging

(No WF  
corrections,  
PB freq  
dependence  
part of sky  
model)



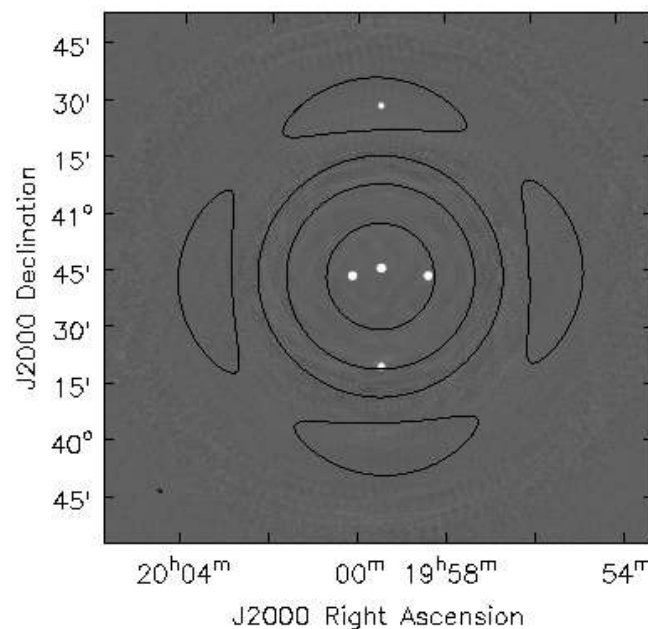
MT-MFS  
wideband  
imaging  
+  
A-Proj

(PB<sup>2</sup> freq  
dependence  
part of sky  
model)



MT-MFS  
wideband  
imaging  
+  
WB-A-Proj

(PB freq  
dependence  
removed  
during  
gridding)



# Wideband VLA imaging of IC10 Dwarf Galaxy

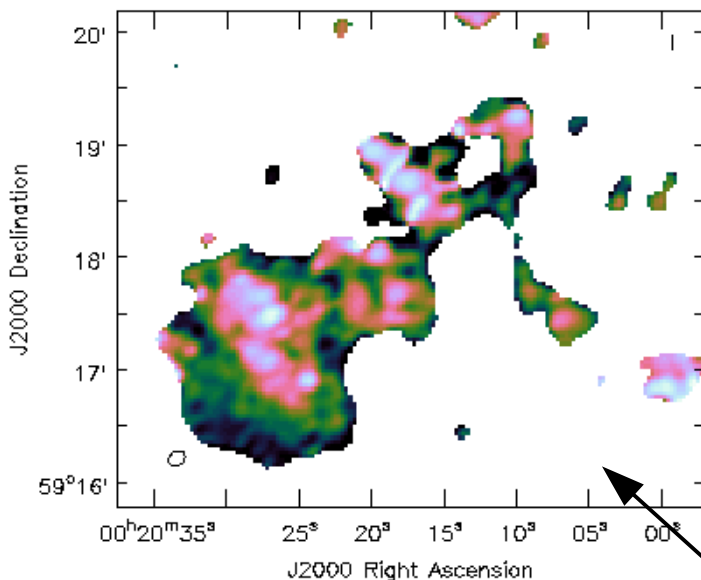
[ Heesen et al, 2011 ]

IC10 Dwarf Galaxy :

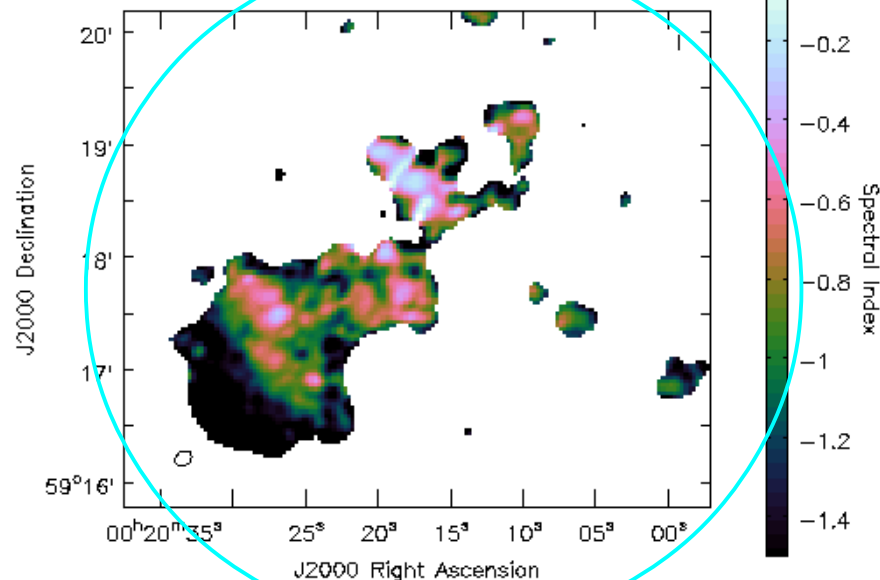
Spectral Index across C-Band.

Dynamic-range ~ 2000

After PB-correction



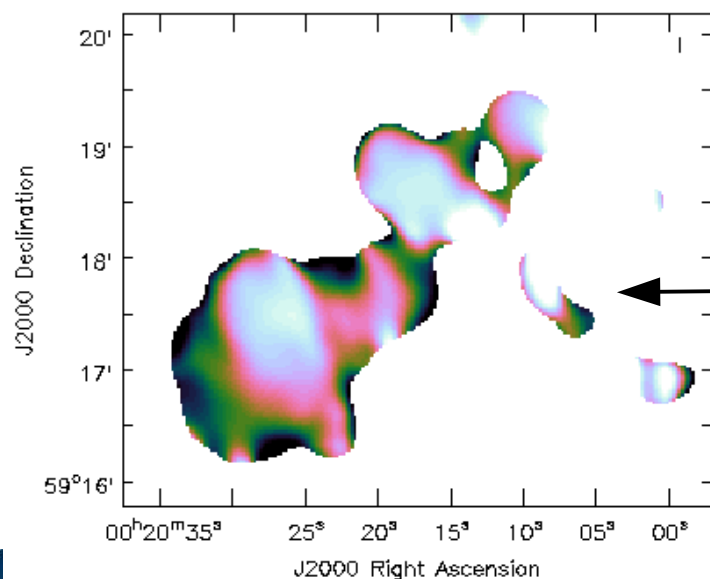
Before PB-correction



50% of PB

MT-MFS : Wide-band PB-correction after multi-term multi-scale MFS.

Cube : Spectral-index map made by cube imaging, smoothing to lowest resolution, and spectral fitting.



Wide Band + Full Beam/Wide-field

+ Mosaics

+ Single Dish

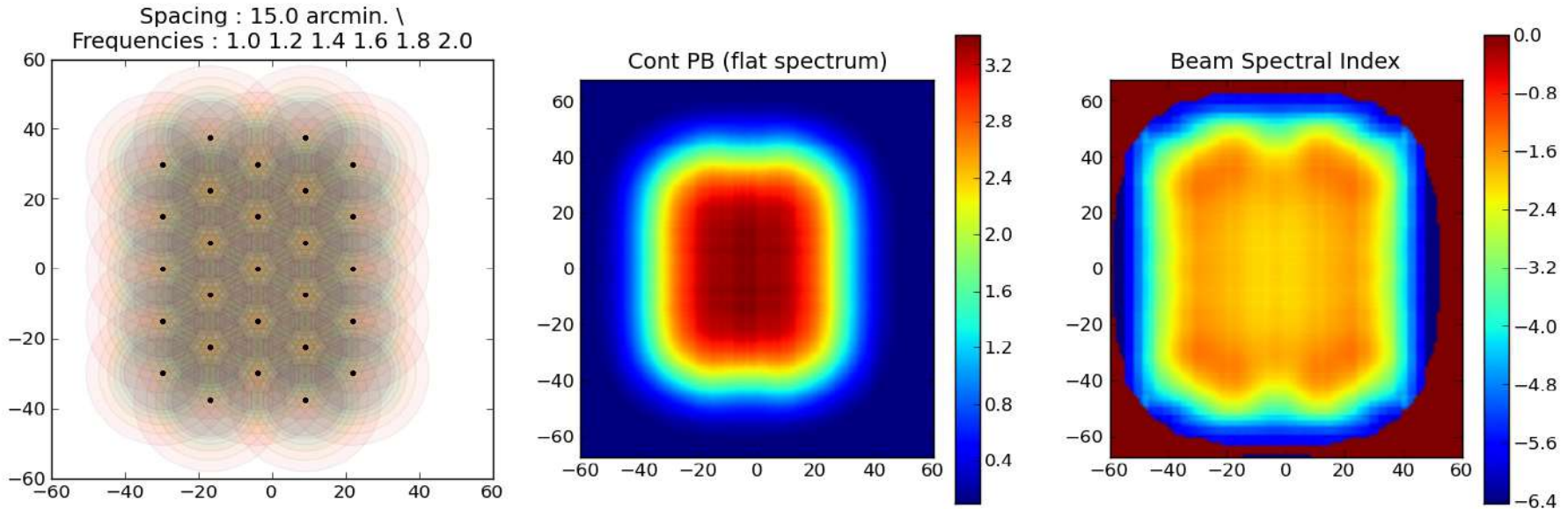
Example : Imaging the G55 supernova remnant

Imaging Framework



# Wide-Band Mosaic Primary Beam

The mosaic primary beam has an artificial spectral index all over the FOV



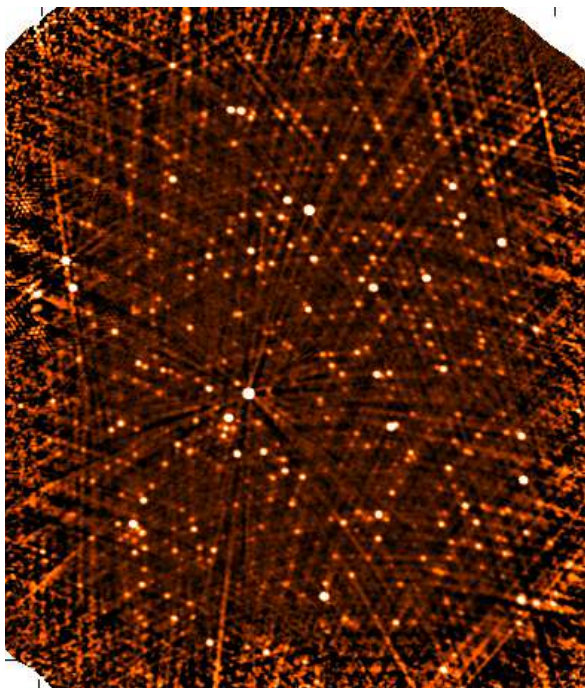
## Algorithms :

- Deconvolve Pointings separately or together ( **Stitched vs Joint Mosaic** )
  - Impacts image fidelity, especially of common sources.
- Deconvolve Channels separately or together ( **Cube vs MFS** )
  - Impacts imaging fidelity and sensitivity, dynamic range
- Use A-Projection or not ( **Accurate vs Approximate PB correction** )
  - Impacts dynamic range and spectral index accuracy

# Wideband Mosaic Imaging Accuracy [ Rau et al, 2016 ]

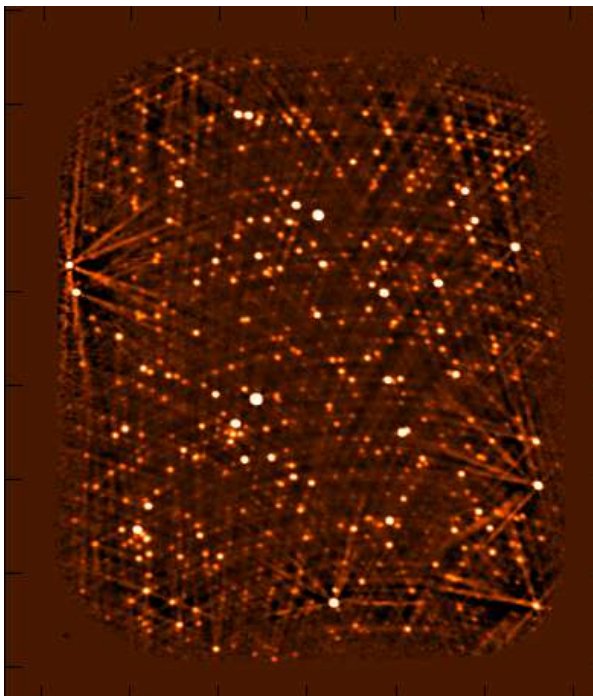
**Cube + Joint Mosaic**  
(with static Primary Beams)

Dyn.Range = 5000:1



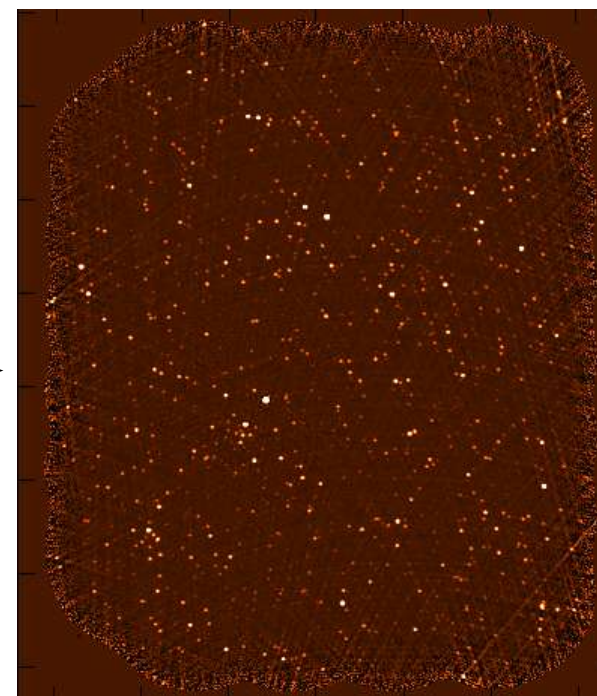
**Cube + A-Projection  
+ Joint Mosaic**

Dyn.Range = 10000:1



**Wideband A-Proj +  
Joint Mosaic +  
Multi-term MFS**

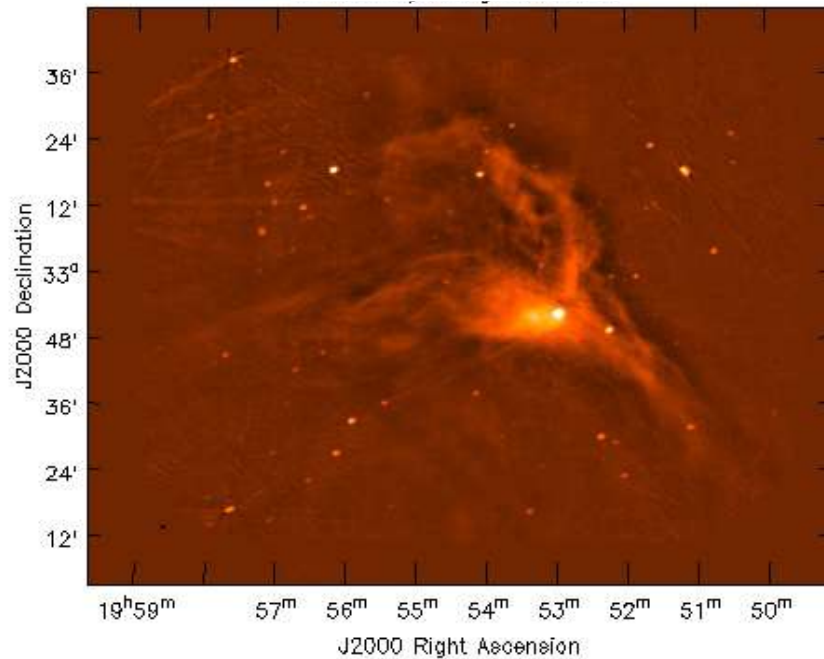
Dyn.Range = 40000:1



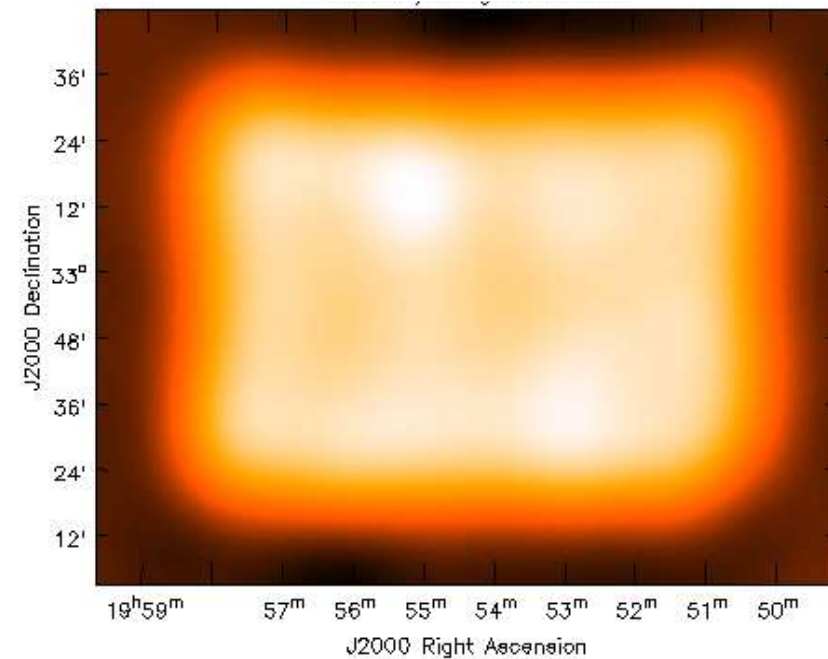
Method	$I/I_{true}$	$I/I_{true}$	$I/I_{true}$	$\alpha - \alpha_{true}$	$\alpha - \alpha_{true}$
Intensity Range	$> 20\mu Jy$	$5 - 20\mu Jy$	$< 5\mu Jy$	$> 50\mu Jy$	$10 - 50\mu Jy$
Cube	$0.9 \pm 0.1$	$0.9 \pm 0.3$	$0.9 \pm 0.5$	$-0.5 \pm 0.2$	$-0.6 \pm 0.5$
Cube + AWP	$1.0 \pm 0.05$	$1.0 \pm 0.2$	$1.0 \pm 0.3$	$-0.15 \pm 0.1$	$-0.1 \pm 0.25$
MTMFS + WB-AWP	$1.0 \pm 0.02$	$1.0 \pm 0.04$	$1.0 \pm 0.15$	$-0.05 \pm 0.05$	$-0.1 \pm 0.2$

# Wideband Mosaic of CTB80 (1-2 GHz, VLA-D config )

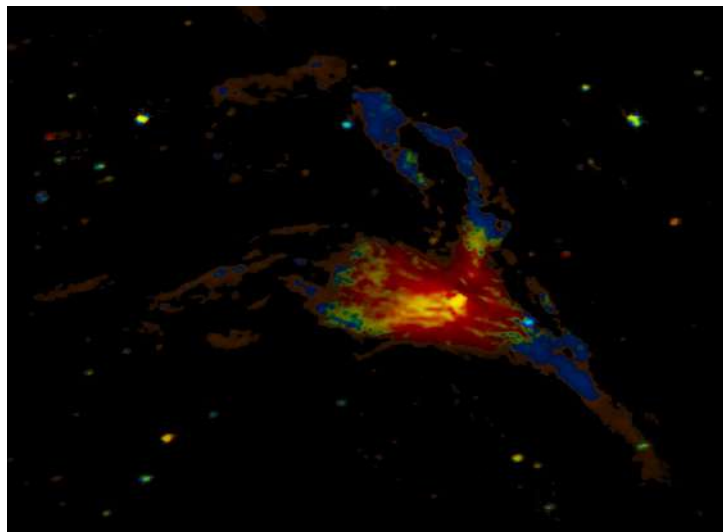
Intensity



Mosaic Primary Beam



Intensity-weighted Spectral Index



300GB calibrated dataset, 106 pointings over 1.5x2 deg, imaged with MS-MT-MFS (NT=2) + WB-A-Projection.

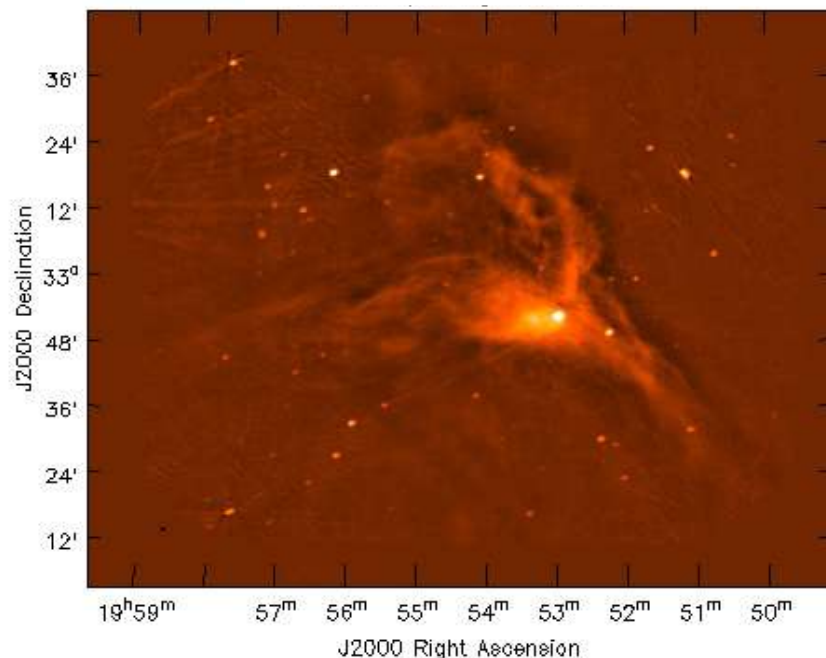
=> Mosaic primary beam spectral index of  $\sim -1.5$  has been removed prior to the wideband sky model fitting.



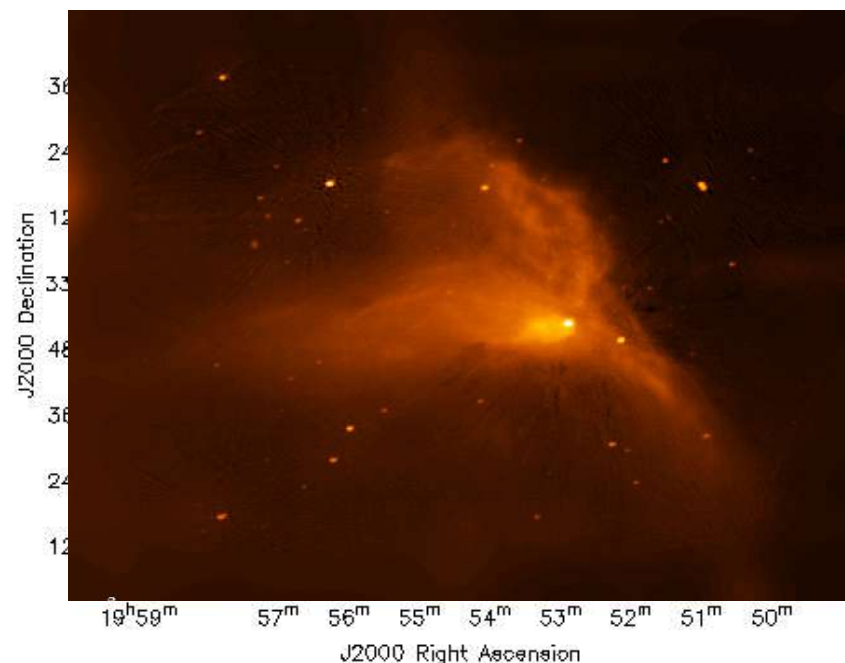
# Wideband Mosaic + Single Dish data

Example : Combining Interferometer intensity image with  
Single dish data at reference frequency, using Feathering.

Int WB Mosaic



Int WB Mosaic + Single Dish



Joint SD+INT Spectral Index Map => Work in progress

Algorithms needed : Multiscale, Multi-term MFS, with A-Projection, W-Projection, form a Joint Mosaic, and Joint deconvolution with wideband single dish data.

( Must run in finite time → robust parallelization )

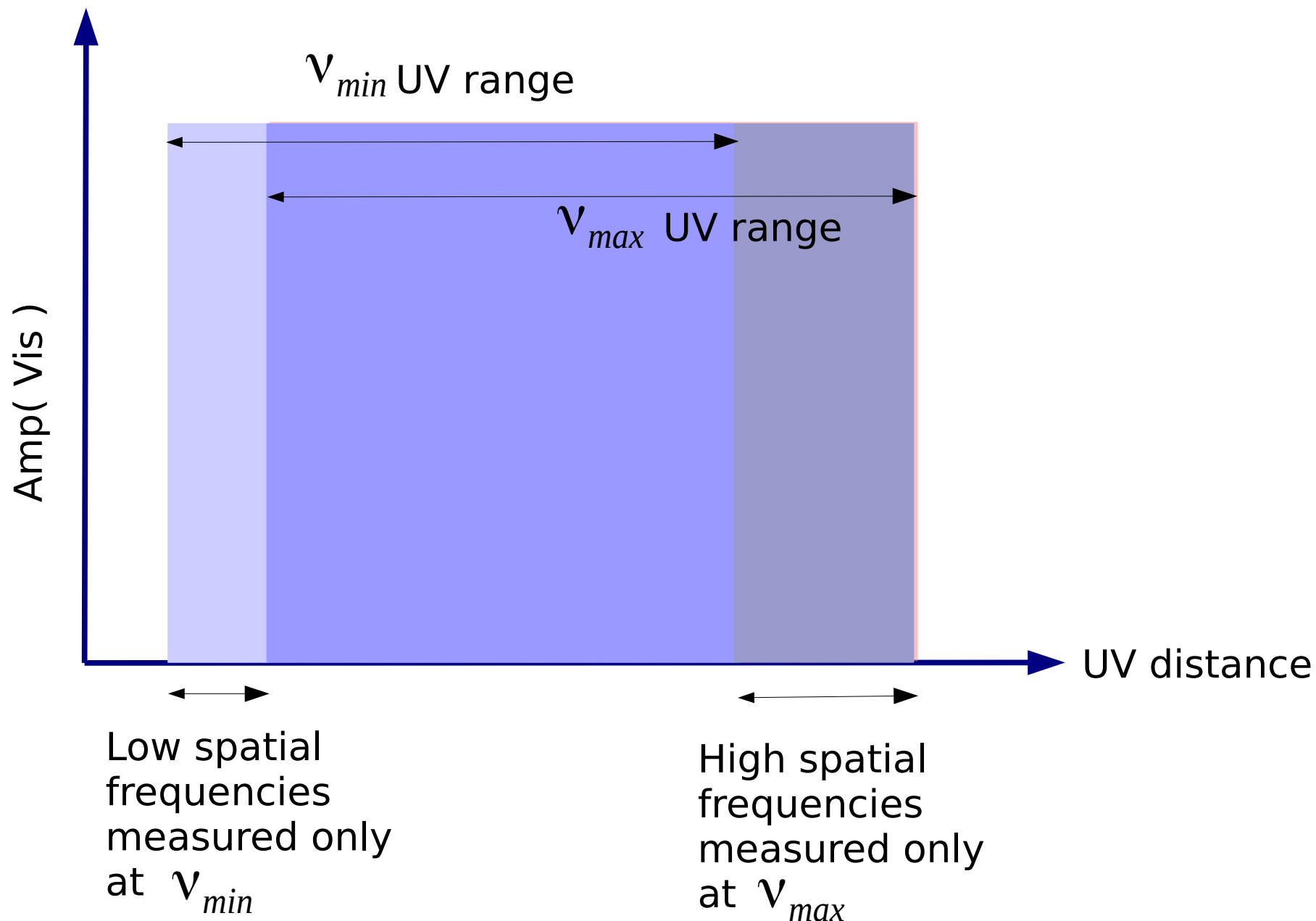
Wide Band + Full Beam/Wide-field  
+ Mosaics  
+ Single Dish

Example : Imaging the G55 supernova remnant

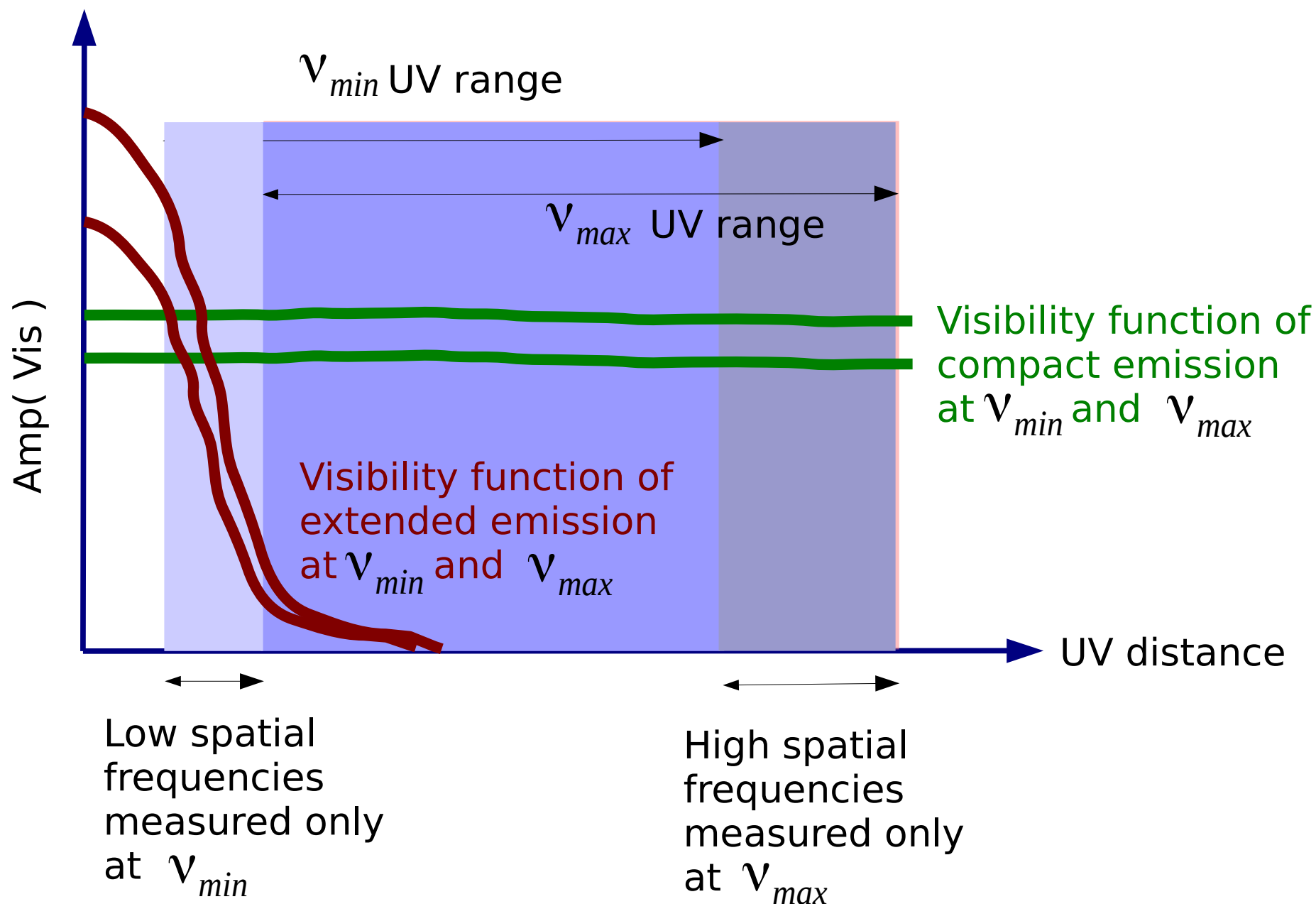
Imaging Framework



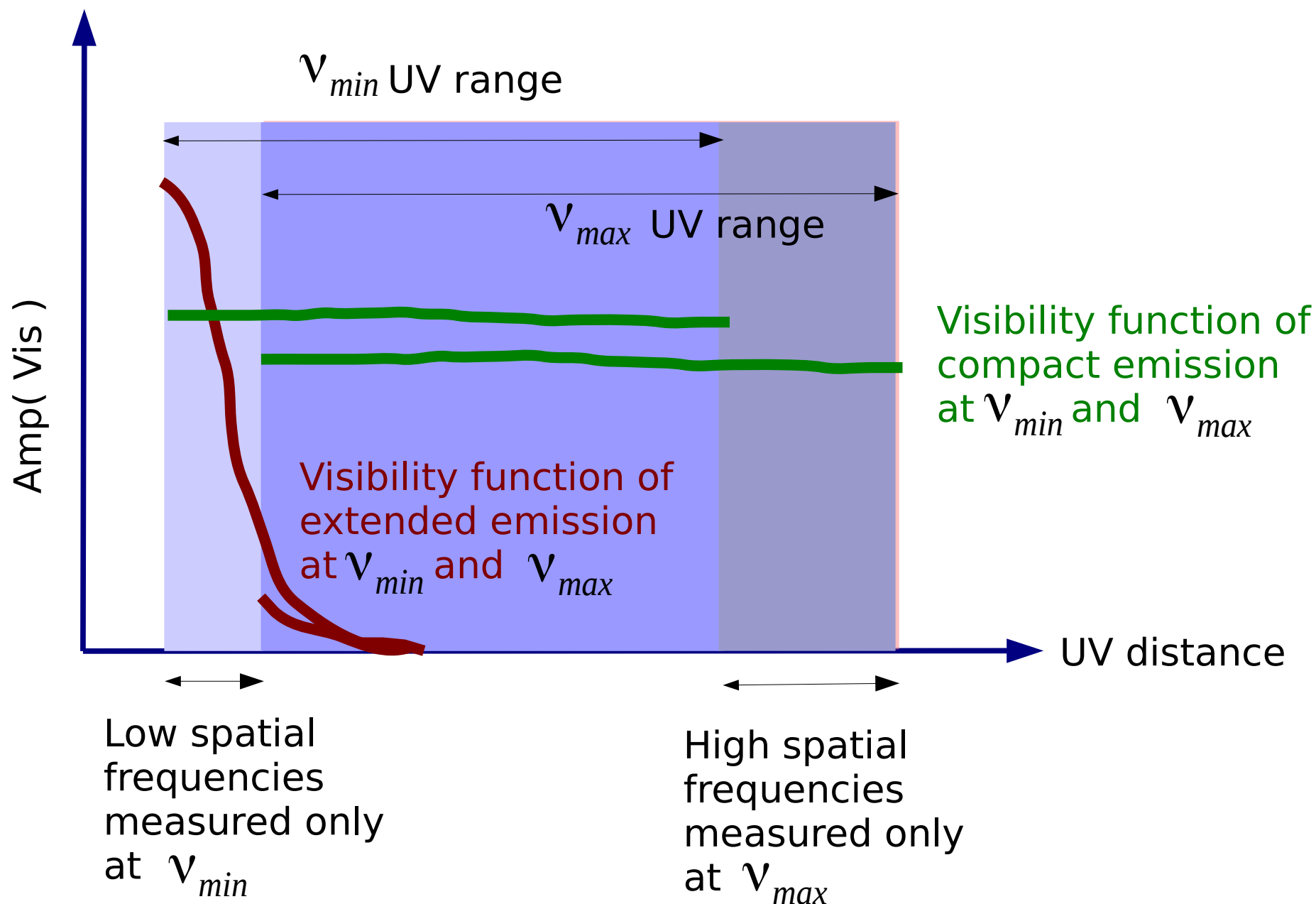
# For which scales can we reconstruct the spectrum ?



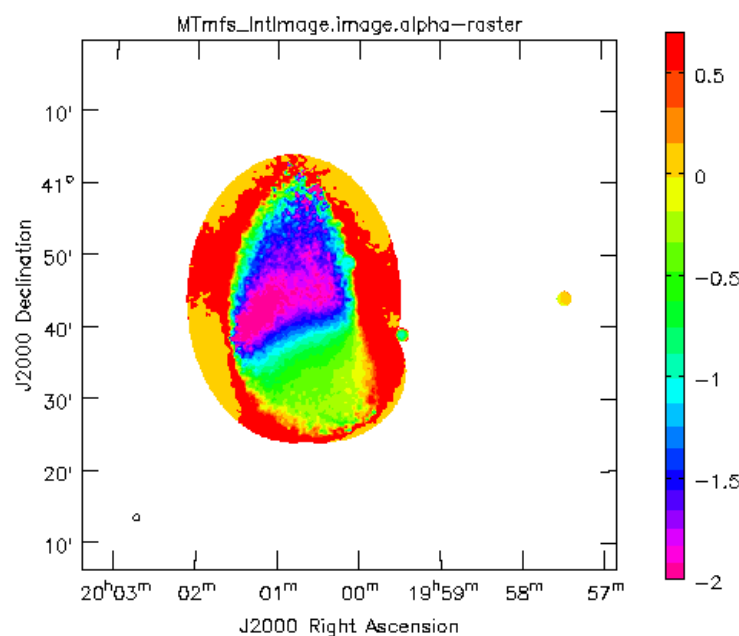
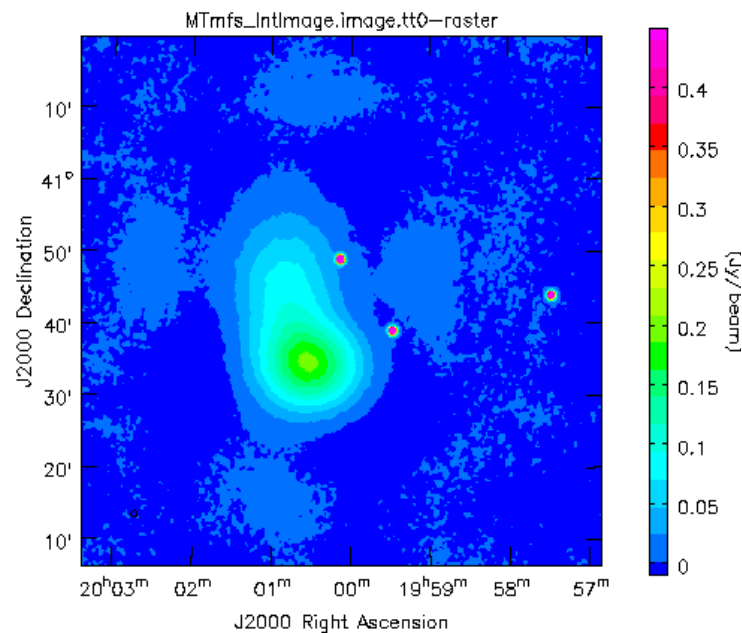
# For which scales can we reconstruct the spectrum ?



# For which scales can we reconstruct the spectrum ?

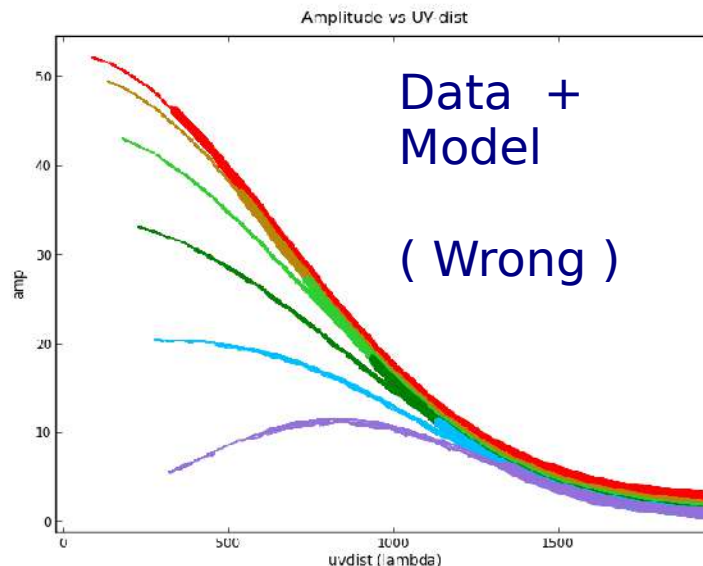
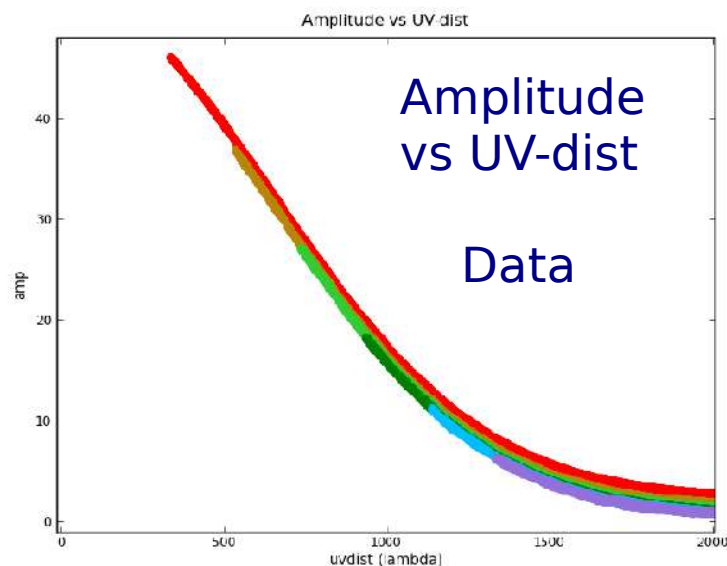


# Very large spatial scales : wideband single dish data



Example : Flat spectrum emission at very large scales

Top : Only interferometer data  
=> Negative bowl and artificial steep spectrum



No short spacings to constrain the spectra

=> False steep spectrum reconstruction

# Wideband Single Dish + Interferometer Combination

Several Algorithms can be applied to wideband data.

(1) **Feathering** : Image SD and INT data separately (in wideband mode)  
Combine outputs using a UV-domain weighted average  
Perform feather per Taylor coefficient map.

=> Works best when noise levels match, weighting choice is obvious, and no mid-scale artifacts in the INT-only reconstruction.

(2) **Startmodel** : Use SD images as a starting model for the INT reconstruction

=> Works if there is clear overlap in UV-range between SD and INT data.

(3) **Artificial visibilities** : Simulate virtual SD visibilities, combine with INT data

=> Flexible, a true joint reconstruction, relative weights handled externally.  
*Koda et al, 2011*

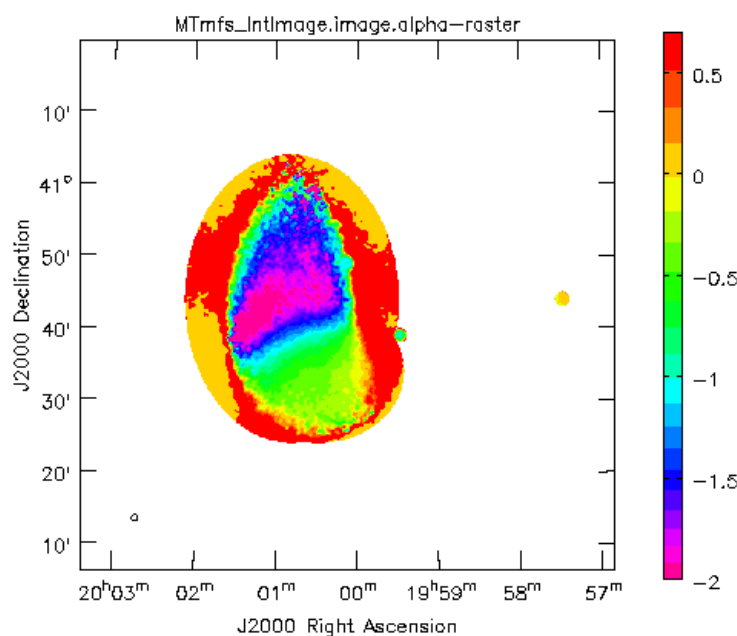
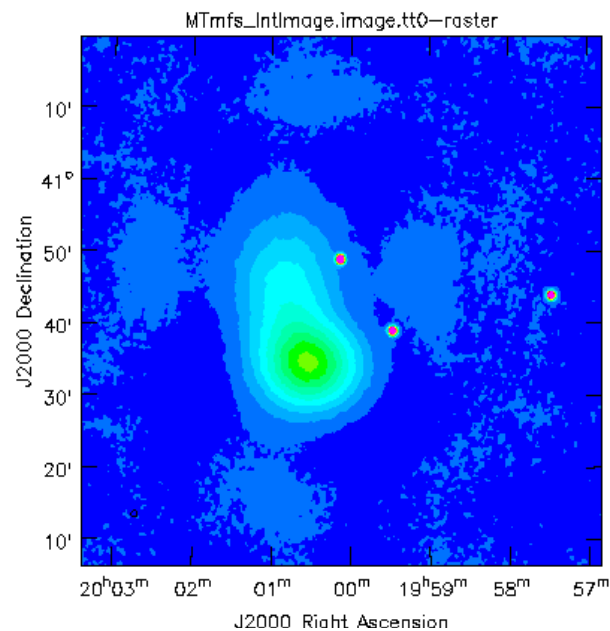
(4) **Merge residual images and PSFs between major and minor cycle** :

=> Flexible, a true joint reconstruction, weight functions part of reconstruction framework, compatible with all wide-field, wide-band algorithms.

*[ Rau & Naik, 2018 ( in prep ) ]*

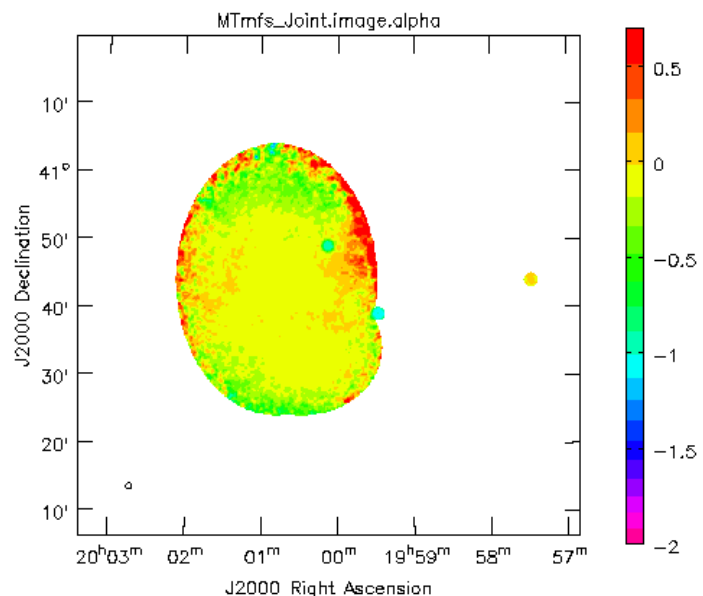
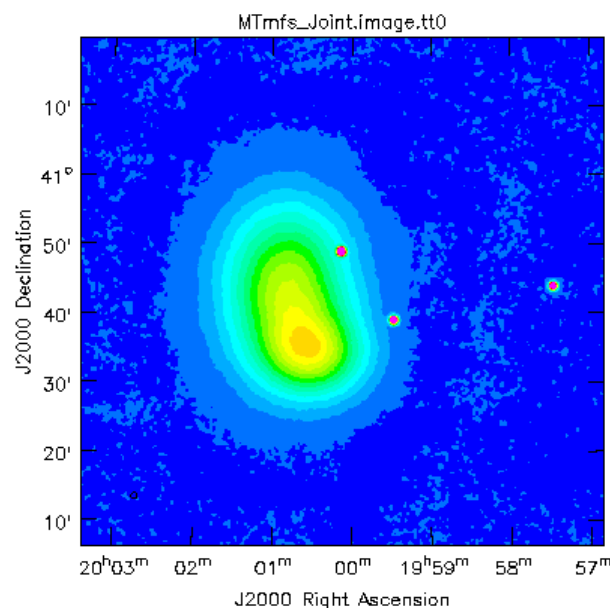


# Very large spatial scales : wideband single dish data



Example : Flat spectrum emission at very large scales

Top : Only interferometer data  
=> Negative bowl and artificial steep spectrum



Bottom : Joint wideband reconstruction (4)

=> Recovers more flux and gets accurate spectrum

=> Compatible with wide-field, wideband, mosaics

Wide Band + Full Beam/Wide-field

+ Mosaics

+ Single Dish

Example : Imaging the G55 supernova remnant

Imaging Framework

## Example : SNR G55.7+3.4

7 hour synthesis, L-Band, 8 spws x 64 chans x 2 MHz, 1sec integrations

Due to RFI, only 4 SPWs were initially imaged ( 1256, 1384, 1648, 1776 MHz )

J2000 Declination

22°00'

45'

30'

15'

21°00'

45'

Imaging Algorithms applied : MS-MFS with AW-Projection

(nterms=2, multiscale=[0, 6, 10, 18, 26, 40, 60, 80] )

Peak Brightness : 6.8 mJy

Extended Emission : ~ 500 micro Jy

Peak residual : 65 micro Jy

Off-source RMS : 10 micro Jy (theoretical = 6 micro Jy)

19<sup>h</sup>26<sup>m</sup>

24<sup>m</sup>

23<sup>m</sup>

22<sup>m</sup>

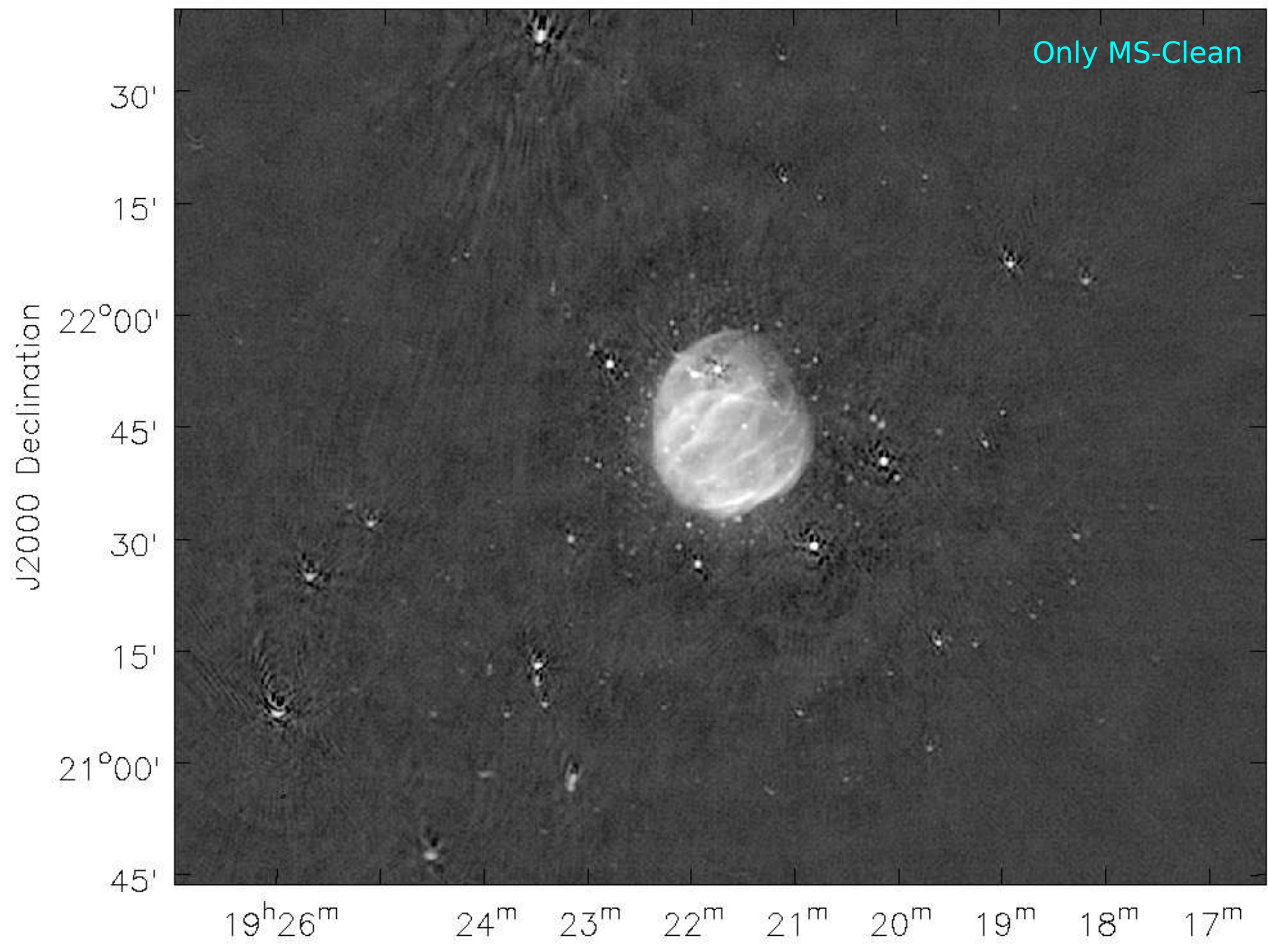
21<sup>m</sup>

20<sup>m</sup>

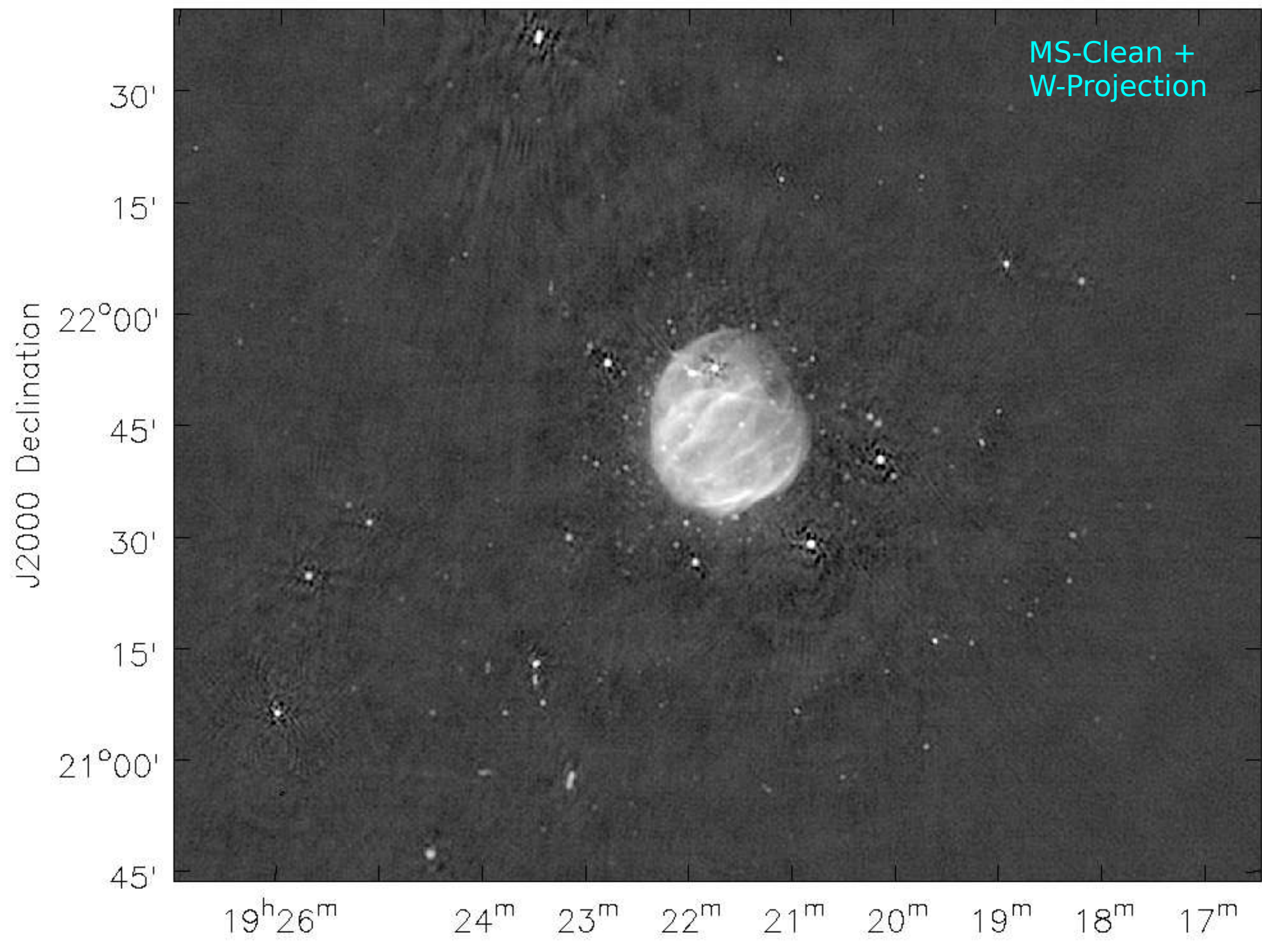
19<sup>m</sup>

18<sup>m</sup>

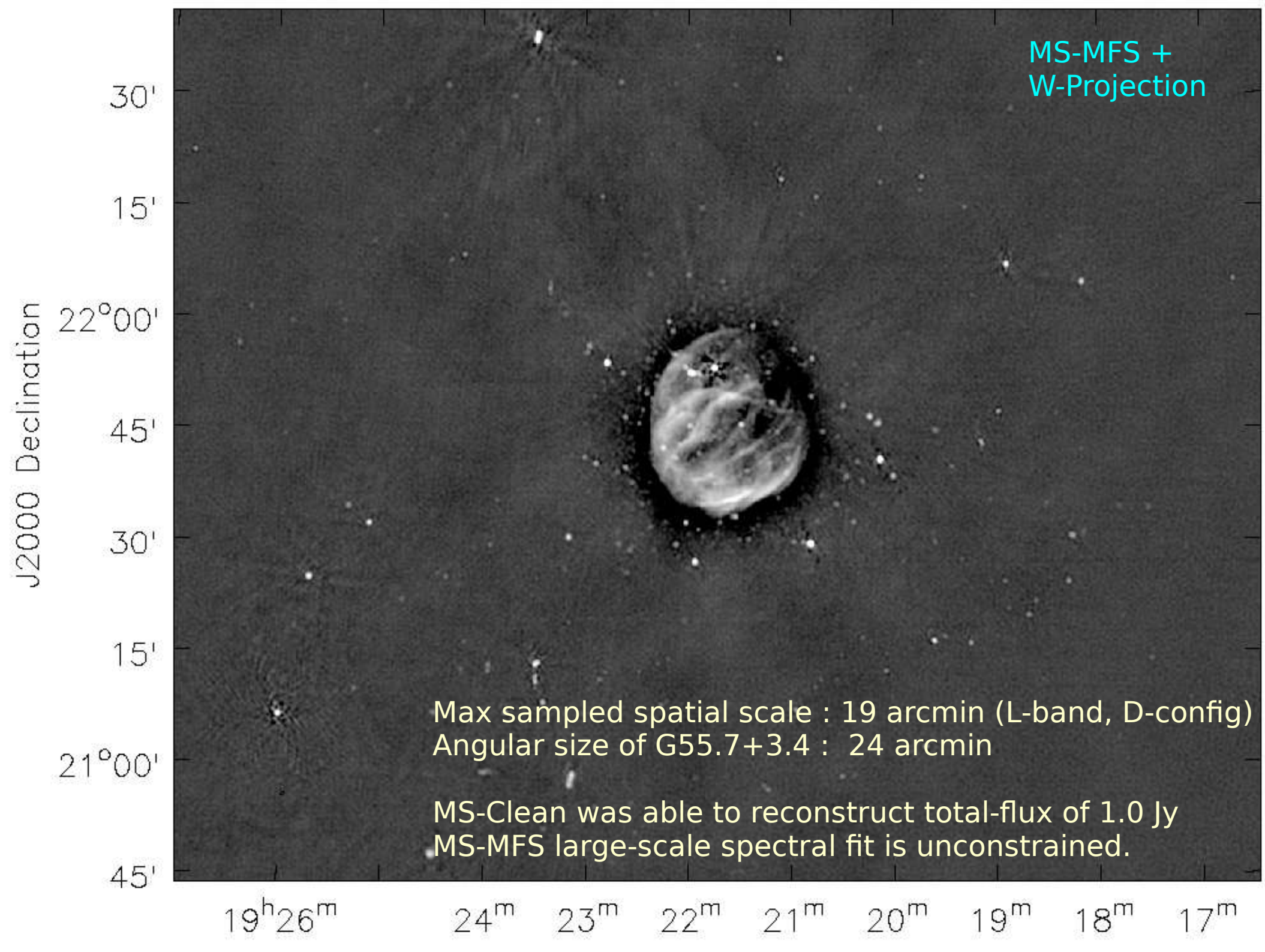
17<sup>m</sup>

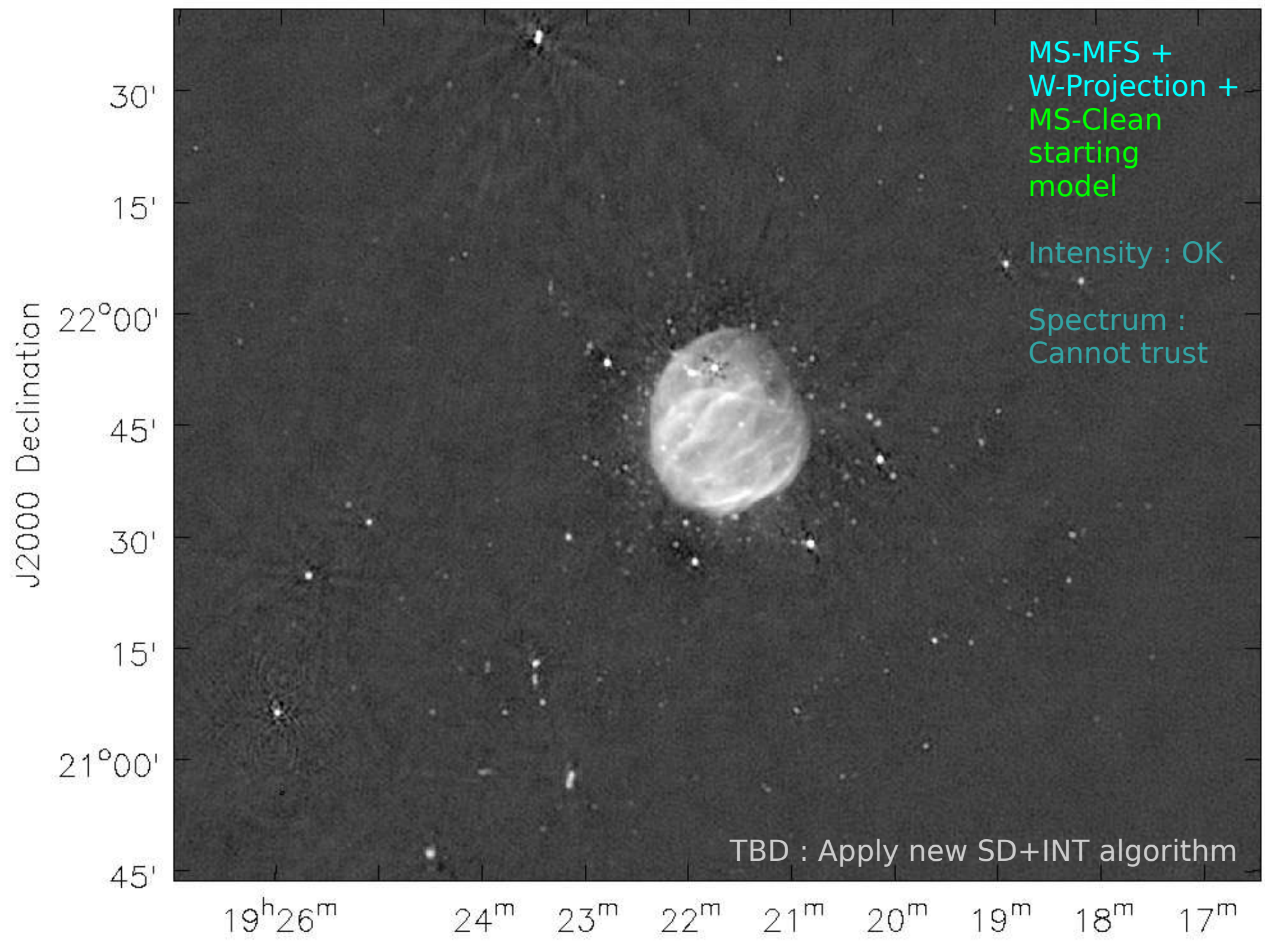












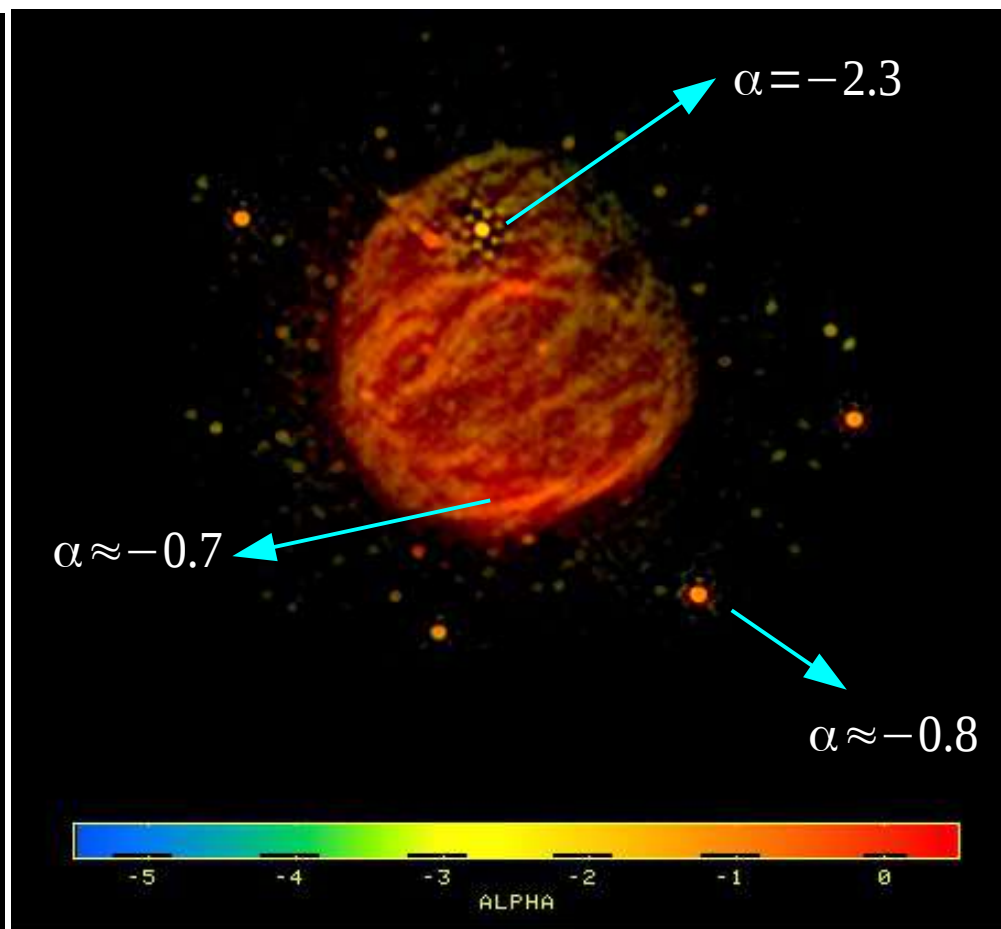
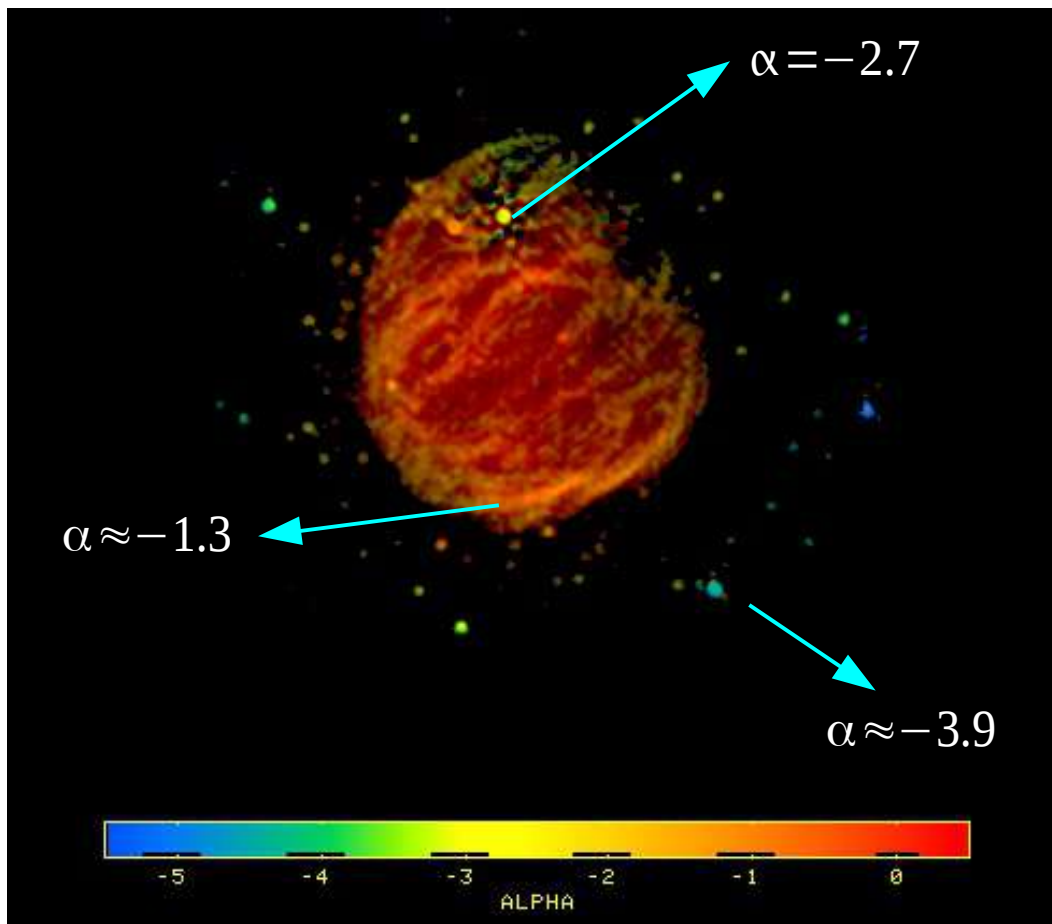
# Spectral Indices before and after WB-A-Projection

Without PB correction

Outer sources are artificially steep

With PB correction (via WB-AWP)

Outer sources have correct spectra



Intensity-weighted spectral index maps ( color = spectral index from -5.0 to +0.2 )



# Wide-field sensitivity because of wide-bandwidths

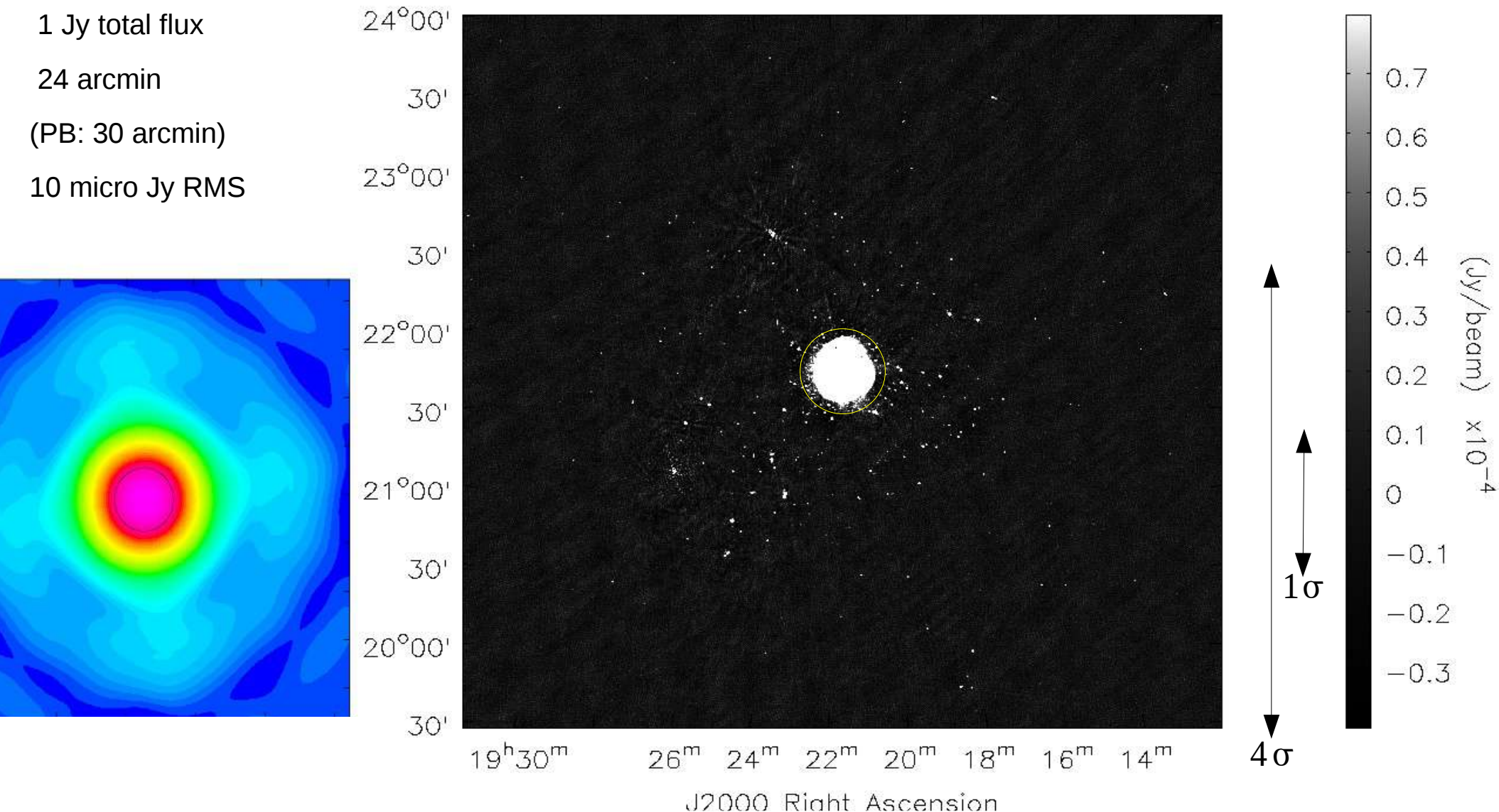
G55.7+3.4 : Field-of-view of 4x4 degrees from one EVLA pointing at 1-2 GHz

1 Jy total flux

24 arcmin

(PB: 30 arcmin)

10 micro Jy RMS



=> Wideband Imaging implies wide-field imaging

Wide Band + Full Beam/Wide-field

+ Mosaics

+ Single Dish

Example : Imaging the G55 supernova remnant

Imaging Framework



# Measurement Equation

The visibility measured by each baseline  $ij$  at one frequency and time

$$V_{ij}^{obs}(\nu, t) = M_{ij}(\nu, t) S_{ij}(\nu, t) \iiint M_{ij}^s(l, m, \nu, t) I(l, m, \nu, t) e^{2\pi i(ul + vm + w(n-1))} dl dm dn$$

**Direction Independent Gains**

- Eliminated during calibration

**Primary Beams**

- Power pattern varies with time, frequency and baseline

- **PBcor (post-deconvolution)**
- **A-Projection**
- **WB-A-Projection**
- **Mosaics**

**Full Beam**

**Sky-brightness varies with frequency (time)**

- All sources have spectral structure (some vary with time)

- **Cube Imaging**
- **Multi-Frequency Synthesis (MFS)**
- **Multi-Term-MFS (point source or multi-scale models)**

**Wide-Band**

**W-Term**

- Non-coplanar baselines
- Sky curvature

- **Faceting**
- **W-Projection**
- **3D FT**
- **W-Stacking**

**Wide-Field**

# Imaging Framework - Major and Minor cycles

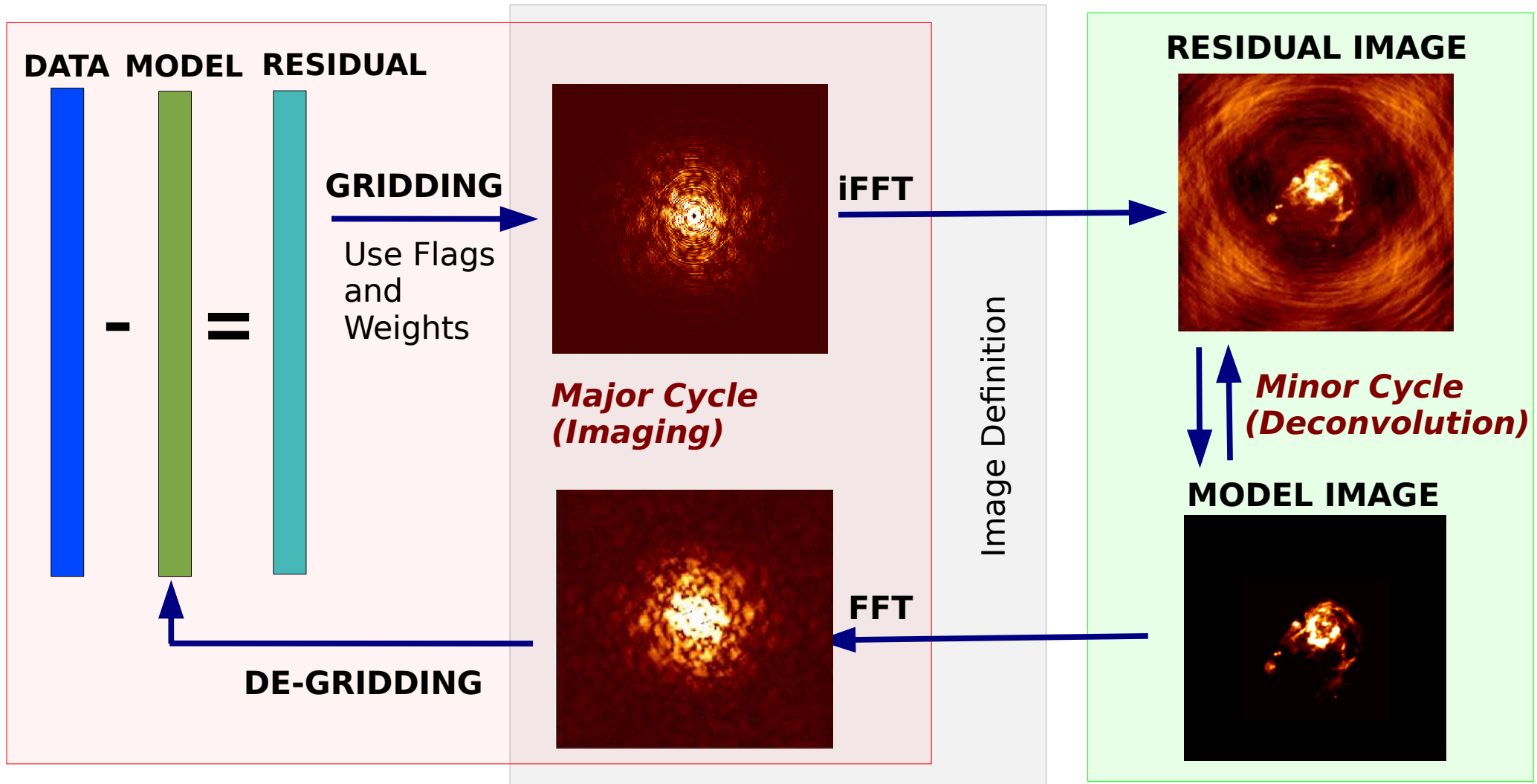
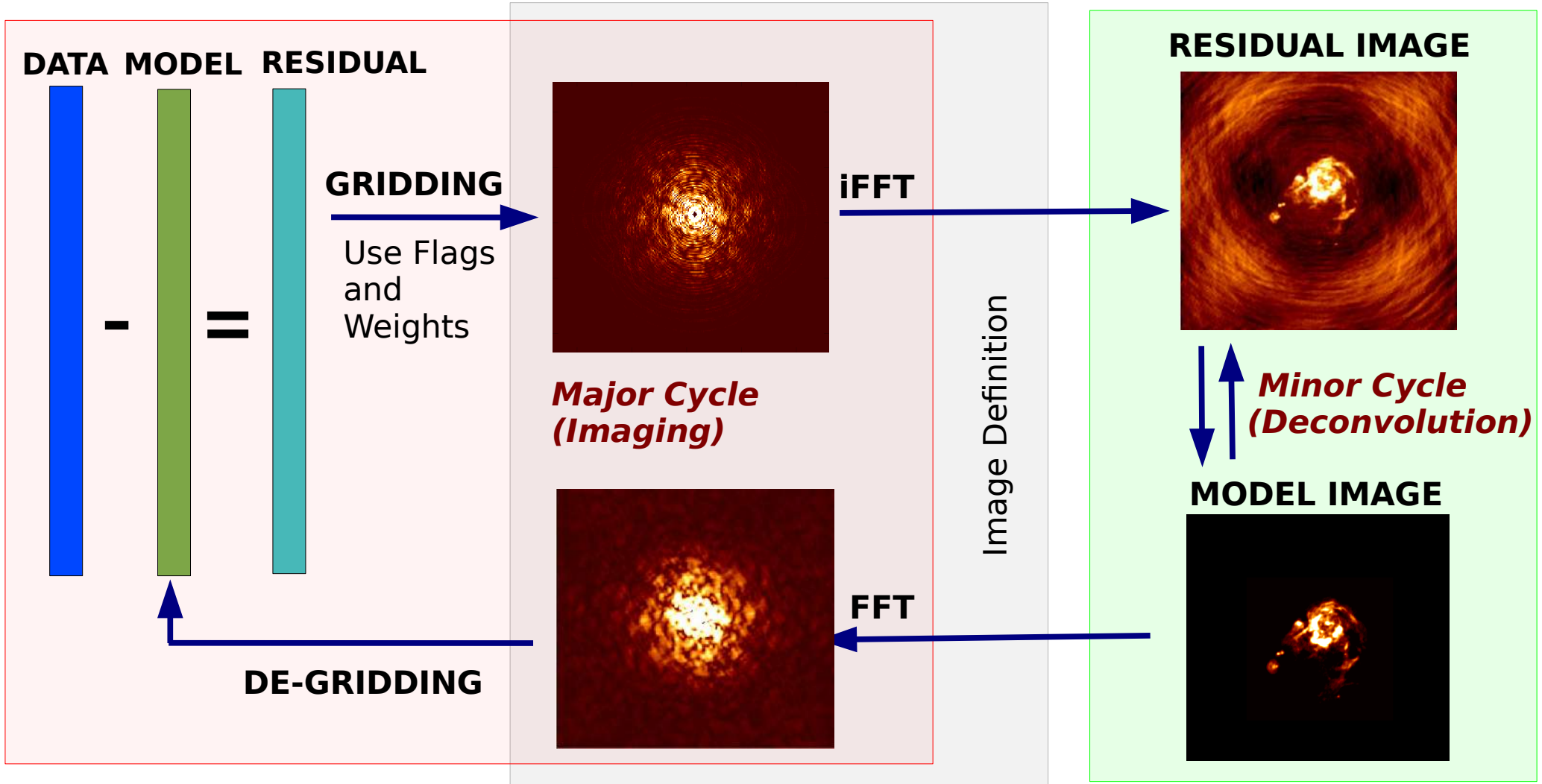


Image reconstruction is an iterative model-fitting / optimization problem

$$\text{Measurement Eqn : } [A] I^m = V^{obs}$$

$$\text{Iterative solution : } I_{i+1}^m = I_i^m + g[A^T W A]^+ (A^T W (V^{obs} - A I_i^m))$$

# Imaging & Deconvolution

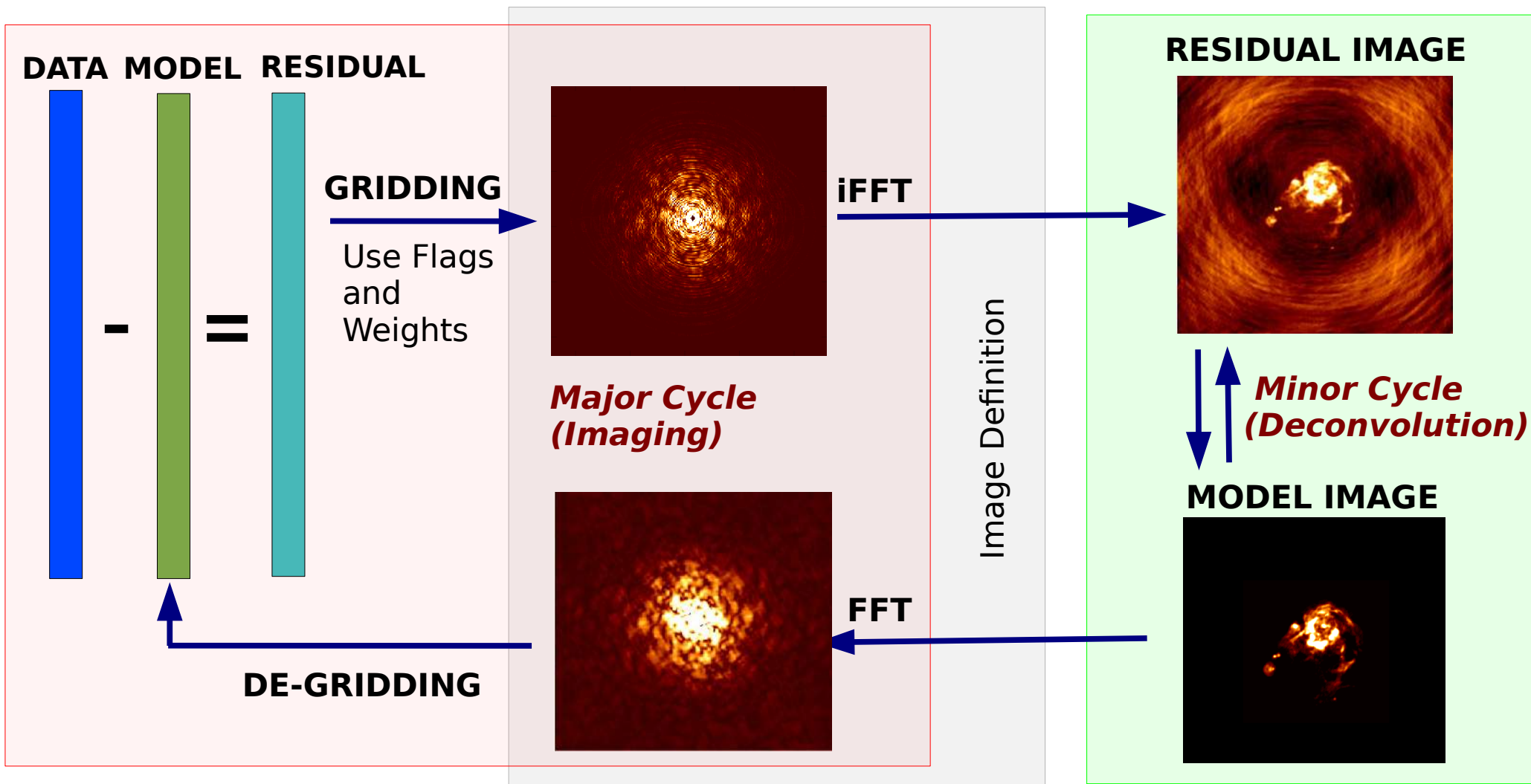


**Instrumental Corrections (applied per visibility during gridding )**

**Mapping of data to Image Shape/Type**

**Solving for the sky model (non-linear optimization)**

# Algorithm Options

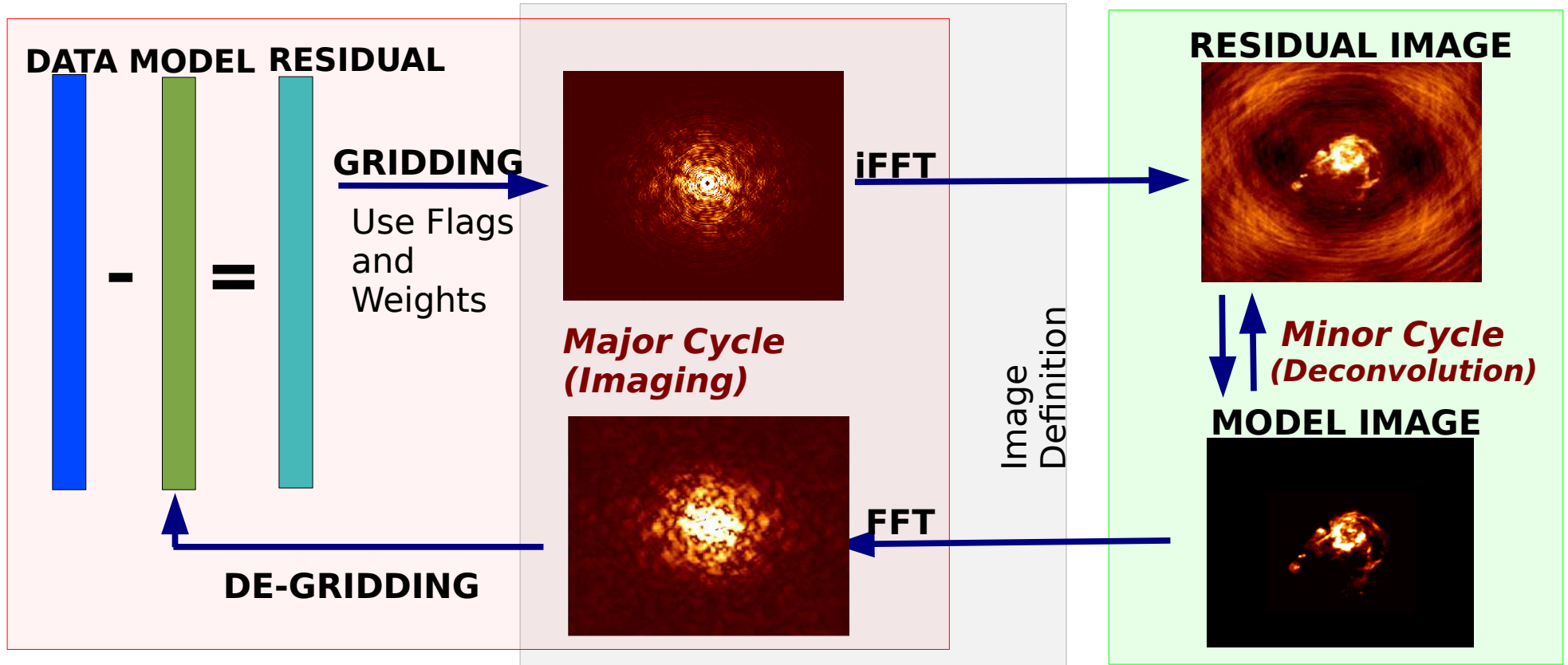


**Standard gridding,  
W-Proj (WB)-A-Proj,  
Joint Mosaics,  
(Parallelization)**

**Cube, MFS, MT-MFS,  
Faceting, Stokes,  
Multi-Field, SD+INT  
Stitched Mosaic**

**Clean ( Hogbom,  
Clark, MultiScale,  
MultiTerm, etc... )**

# Computational Cost



Runtime and computing resources depend on many factors.

=> Choose algorithms wisely....

- (a) Data Volume, (b) Gridding Algorithm, (c) Joint vs Separate reconstructions,
- (d) Deconvolution algorithm, (e) Sky brightness structure and convergence rate
- (f) Dynamic range, calibration accuracy (g) Iteration Control



# Summary – Lectures 1 & II

## Wide Band Imaging

Sky and instrument change with frequency

=> Cube vs MFS, wideband/multiscale model, spectral index

## Wide Field Imaging

non-coplanar baselines and the W-term

=> W-Projection, W-Stacking, Faceting, 3D FFTs

## Full Beam Imaging

antenna primary beams

=> pbcor, A-Projection, beam models

**Wide-Band + Primary-Beams + Mosaics + W-term + Single-Dish**  
( + Full-Pol + Clean/MS-Clean/etc... )

## Major/Minor Cycle Imaging Framework

=> Flexible imaging framework that logically organizes all the pieces

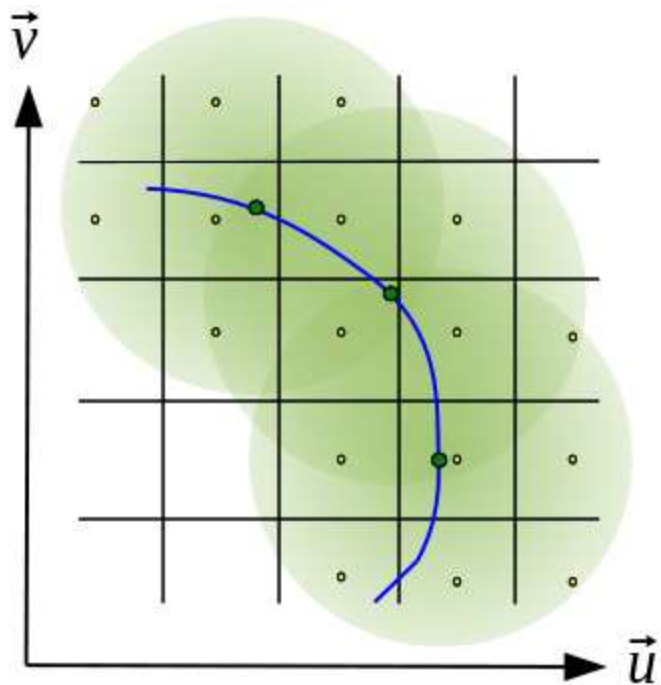
Need to choose algorithms carefully

[[ Algorithm/software development is ongoing to refine all these ideas ! ]]

EXTRA SLIDES

# Major Cycle : Data to Image, Model to Data

Gridding = Convolutional Resampling of visibilities to a regular grid

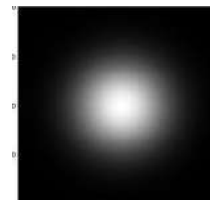


Convolution in UV-domain (per vis)  
= Multiplication in Sky domain

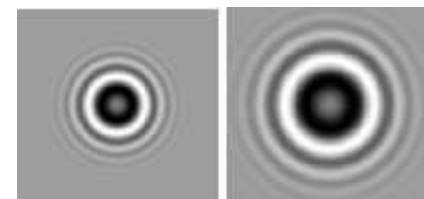
=> Handle wide-field imaging effects

Degridding : Model  $\rightarrow$  Data

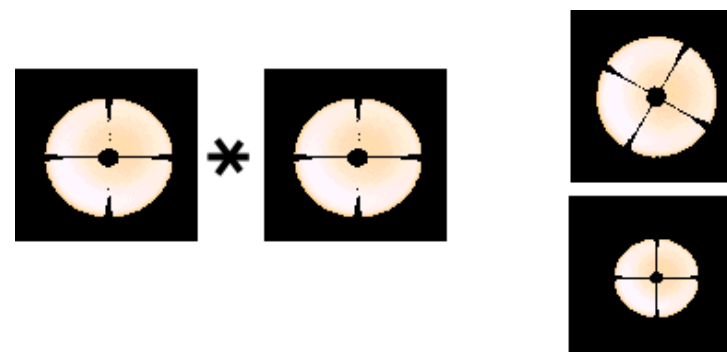
Standard Imaging :  
Prolate Spheroidal



W-Projection :  
FT of a Fresnel  
kernel



A-Projection :  
Baseline aperture illumination functions  
+ phase gradients for joint mosaics



Combined algorithms :  
Convolutions of different kernels

# Minor Cycle : Solving for a sky model

## For Point Sources :

- Hogbom Clean
- Clark Clean

## For Point/Extended Sources :

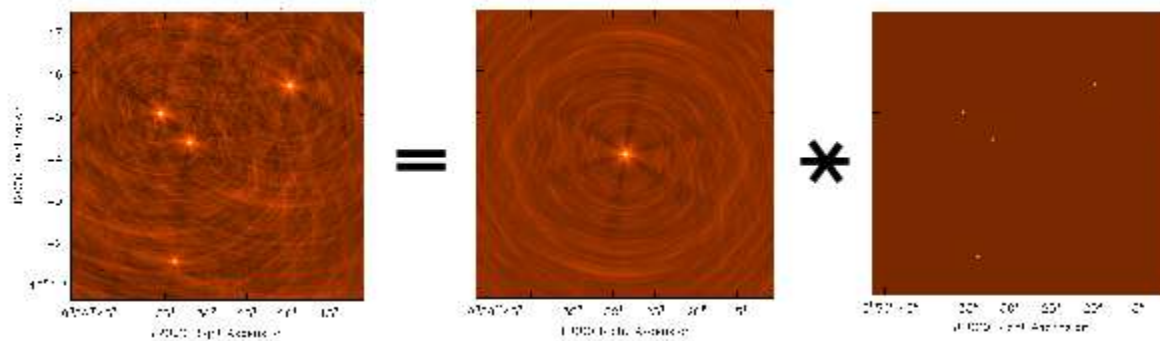
- Multi-Scale-Clean

## For Wide-band Sky models

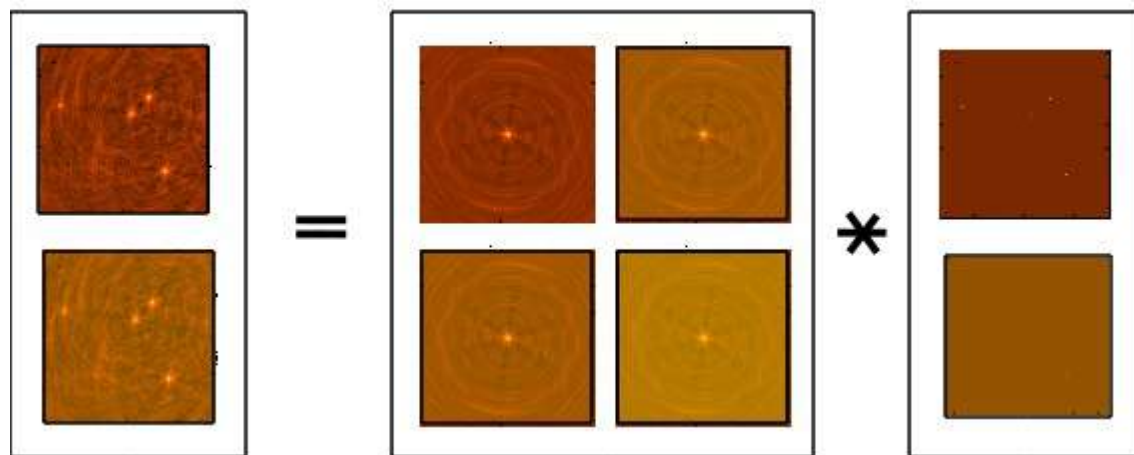
- Multi-Term MFS Clean  
with or without Multi-Scale

(similar algo for time-variability)

Convolution Equation ==> Deconvolution



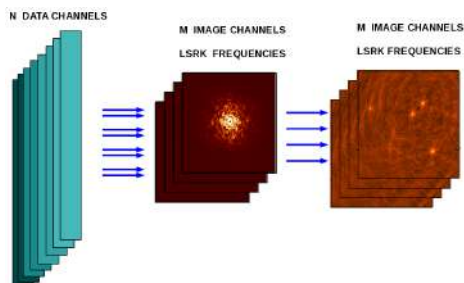
Multi-Term Convolution Equation  
==> Joint Deconvolution



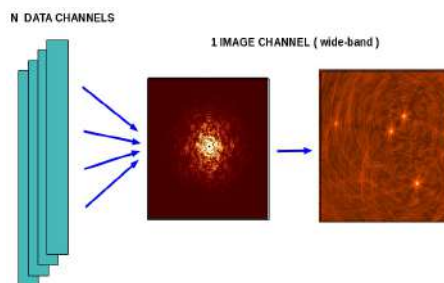
Other potential options : Any non-linear image-domain solver  
E.x. Compressed sensing ideas : Gaussians (ASP), Wavelets (SARA/PURIFY),  
Bayesian forms (MEM, RESOLVE, etc), wide-band non-parametric models, etc..

# Mapping data to image coordinates/shapes

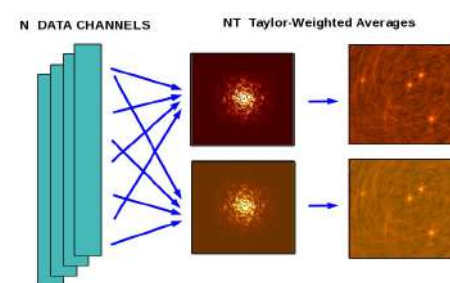
## Spectral Cube



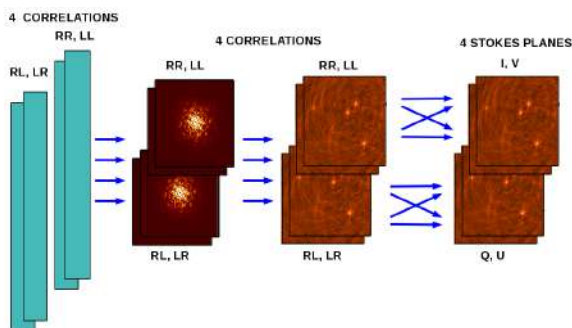
## Continuum



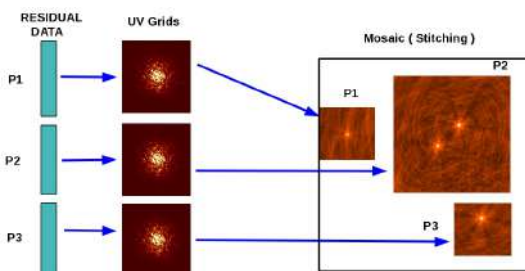
## Wideband Continuum



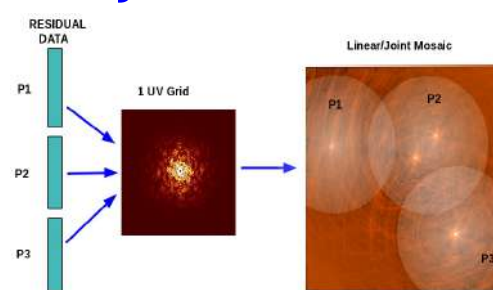
## Stokes Planes



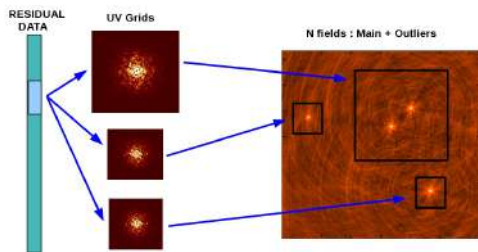
## Stitched Mosaic



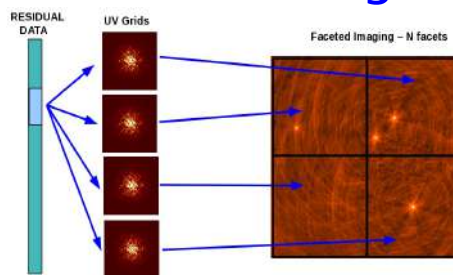
## Joint Mosaic



## Multi-Field



## Faceting



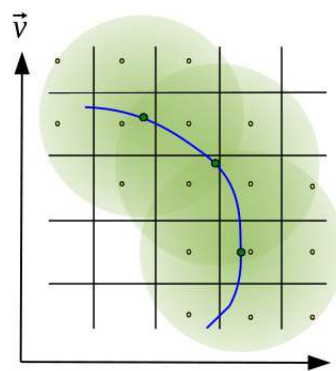
Different algorithms arise from different mappings of data to images

<https://casa.nrao.edu/casadocs/casa-5.1.2/synthesis-imaging/image-definition>



# Computational Costs

Imaging runtime and compute resources depend on data size, sky signal, and algorithms chosen



Gridding : Convolutional resampling

$O(N_{\text{data}}) \times (n \times n)$  complex multiply/add ( $n=5 - 100$ )  
 $\Rightarrow$  Compute load :  $O(N_{\text{data}}) * 10^{\{2-5\}}$  flops

Data parallelization, Multi-threading, GPUs, etc...

Example : Major cycle : 1hr  $\rightarrow$  10 days (Diff Algorithms)

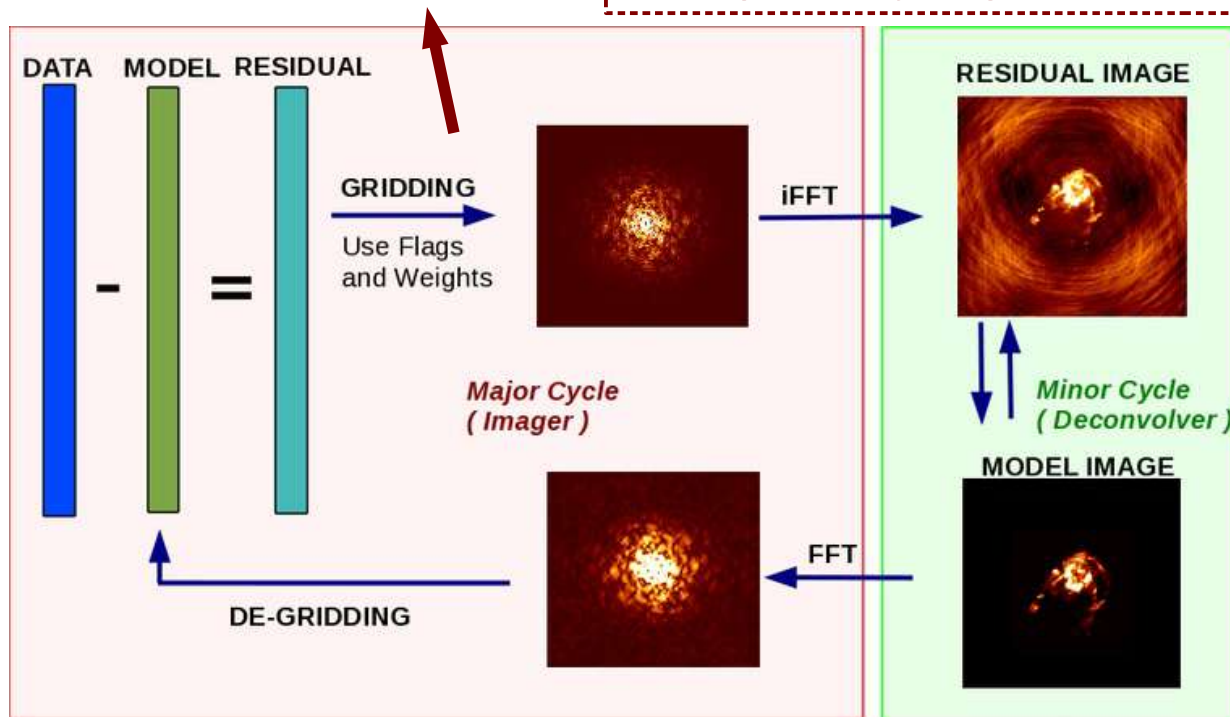
Data volume

$N_{\text{data}} =$   
 $\bar{N}_{\text{ant}}^2 \times$   
 $N_{\text{chan}} \times$   
 $N_{\text{pol}} \times$   
 $N_{\text{time}}$

Complex numbers

Lustre I/O

Example :  
 8hr data  
 300 GB



Number of iterations : 5 - 10 major cycle loops  
 $10^2$  to  $10^4$  minor cycle steps

Runtime varies by 1-2 orders of magnitude. Depends on data.

Image sizes

$N_{\text{pix}} = N_x \times N_y \times$   
 $N_{\text{chan}} \times N_{\text{pol}}$

Real / Complex  
 FFTs :  $O(N \log N)$   
 Pixel math:  $O(N^2)$   
 Mem :  $\sim 8$  copies

Multi-threading  
 Chan parallelization

$N_x$  : 1k  $\rightarrow$  40k  
 $N_{\text{chan}}$  : 200 - 16K

Example :  
 1K x 1K x 256  
 $\sim 1$  GB per image

# Wide Band + Full Beam Imaging – Some guidelines

- MFS has better imaging fidelity, resolution and sensitivity than Cube
  - For 2:1 bandwidth, the dynamic range limit with standard MFS (no spectral model) is few 100 to 1000 for a spectral index of -1.0
- MT-MFS gives HDR images when the spectral model is appropriate and there is sufficient SNR.
  - For point sources, spectral index errors  $< 0.1$  for  $\text{SNR} > 50$  ( 2:1 bwr )  
for  $\text{SNR} > 10$  ( 4:1 bwr )
  - For extended emission, spectral index errors  $< 0.2$  for  $\text{SNR} > 100$
- W-Projection is more accurate and faster than Faceting
  - For D-config,L-Band, uncorrected W errors are visible outside 1 deg
- PBcor assumes invariant beams, (WB)-A-Projection handles variability
  - Uncorrected VLA beam squint and rotation causes  $\text{DR} < \text{few} \times 10^4$
  - For 2:1 bwr, the PB's artificial spectral index at the HPBW is -1.4