

# Wide-Band and Wide-field Imaging : Concepts



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# Radio Interferometry – Measurement Equations

$$V_{ij}^{obs}(\nu, t) \approx M_{ij}(\nu, t) S_{ij}(\nu, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

Observed  
visibilities  
(Data)

Direction  
Independent  
Gains

UV sampling  
pattern

Sky Brightness  
(Image)

Fourier transform  
kernel

# Calibration

$$V_{ij}^{obs}(\nu, t) \approx M_{ij}(\nu, t) S_{ij}(\nu, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

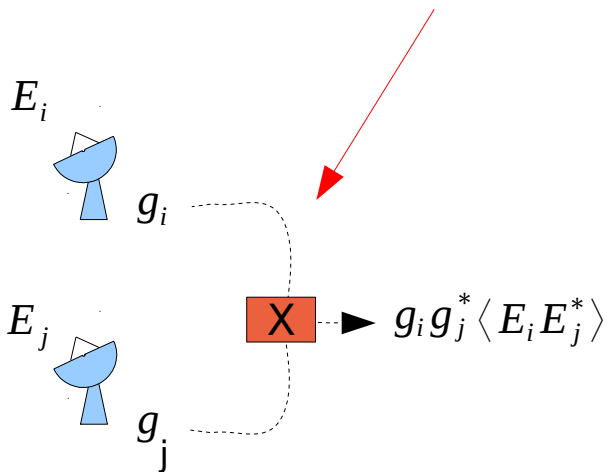
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Sky Brightness  
(Image)

Fourier transform  
kernel



## Calibration

Solve for  $g_i$  and divide out  $g_i g_j^*$

[ Ref : J.Marvil Calibration lecture ]

N antennas

$N(N-1)/2$  antenna-pairs (baselines)

# Imaging & Deconvolution

$$V_{ij}^{obs}(\mathbf{v}, t) \approx M_{ij}(\mathbf{v}, t) S_{ij}(\mathbf{v}, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

Observed or  
Calibrated  
visibilities  
(Data)

Direction  
Independent  
Gains

UV sampling  
pattern

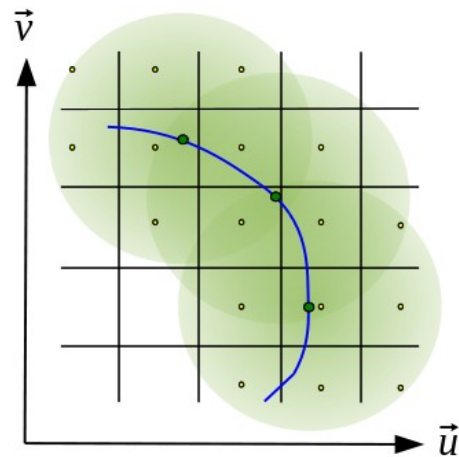
Sky Brightness  
(Image)

Fourier transform  
kernel

**Imaging**

Gridding  
+  
IFFT  
+  
Normalization

$I^{obs}$



Convolutional  
resampling

Accumulate  
measured  
visibilities onto a  
regular grid

# Imaging & Deconvolution

$$V_{ij}^{obs}(\nu, t) \approx M_{ij}(\nu, t) S_{ij}(\nu, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

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**Imaging**

Gridding

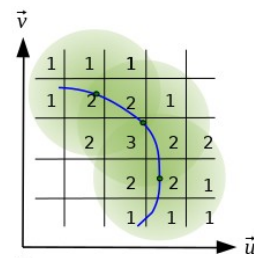
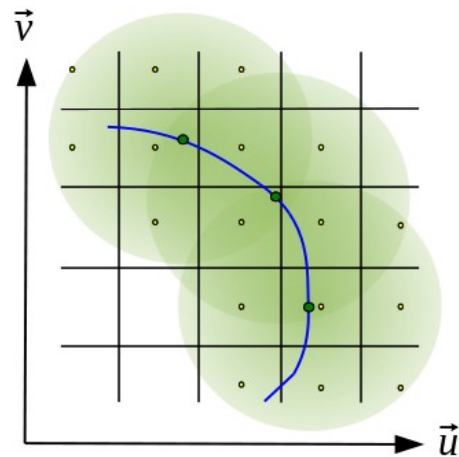
+

IFFT

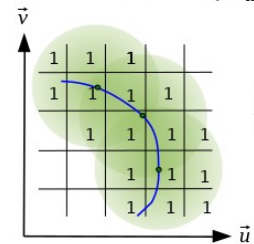
+

Normalization

$I^{obs}$



Natural  
Weights



Uniform  
Weights

Data weighting  
schemes during  
image formation

=> adjust  
sensitivity to  
different spatial  
scales

# Imaging & Deconvolution

$$V_{ij}^{obs}(\nu, t) \approx M_{ij}(\nu, t) S_{ij}(\nu, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

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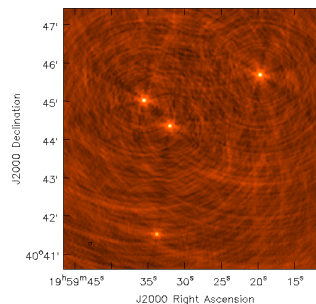
Fourier transform  
kernel

Gridding  
+  
IFFT  
+  
Normalization

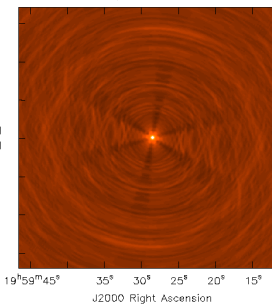
**Deconvolution**

$I^{obs}$

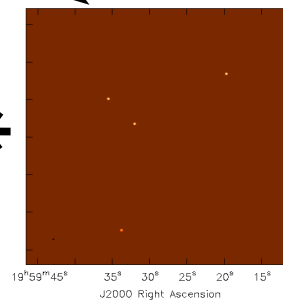
$$I^{obs}(l, m) = I^{PSF}(l, m) * I^{sky}(l, m)$$



=



\*



Algorithms :  
Clean, MS-Clean, Asp, etc...

[ Ref : Imaging : D. Wilner ]

# All together....

$$V_{ij}^{obs}(\nu, t) \approx M_{ij}(\nu, t) S_{ij}(\nu, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

Observed or  
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Sky Brightness  
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Fourier transform  
kernel

**Calibration**

**Imaging  
+  
Deconvolution**

# Self-Calibration

$$V_{ij}^{obs}(\nu, t) \approx M_{ij}(\nu, t) S_{ij}(\nu, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

Observed or  
Calibrated  
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(Data)

Direction  
Independent  
Gains

UV sampling  
pattern

Sky Brightness  
(Image)

Fourier transform  
kernel

**Calibration**

Keep  $I(l, m)$  fixed

**Imaging  
+  
Deconvolution**

Keep  $M_{ij}(\nu, t)$  fixed

**Self-Calibration**



# Radio Interferometry – Measurement Equations

$$V_{ij}^{obs}(\nu, t) \approx M_{ij}(\nu, t) S_{ij}(\nu, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

Observed or  
Calibrated  
visibilities  
(Data)

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**This is only an approximation.....**

# Radio Interferometry – Measurement Equations

$$V_{ij}^{obs}(\nu, t) \approx M_{ij}(\nu, t) S_{ij}(\nu, t) \iint I(l, m) e^{2\pi i(ul+vm)} dl dm$$

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

Direction  
Independent  
Gains

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency (time)

W-Term

# Radio Interferometry – Measurement Equations

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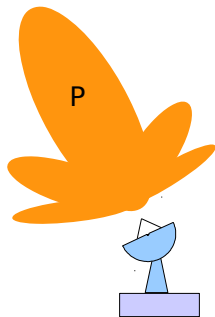
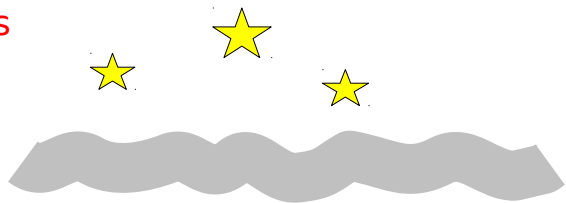
**Primary beams and signal propagation effects...**

# Wide-Field Imaging : Direction dependent effects

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

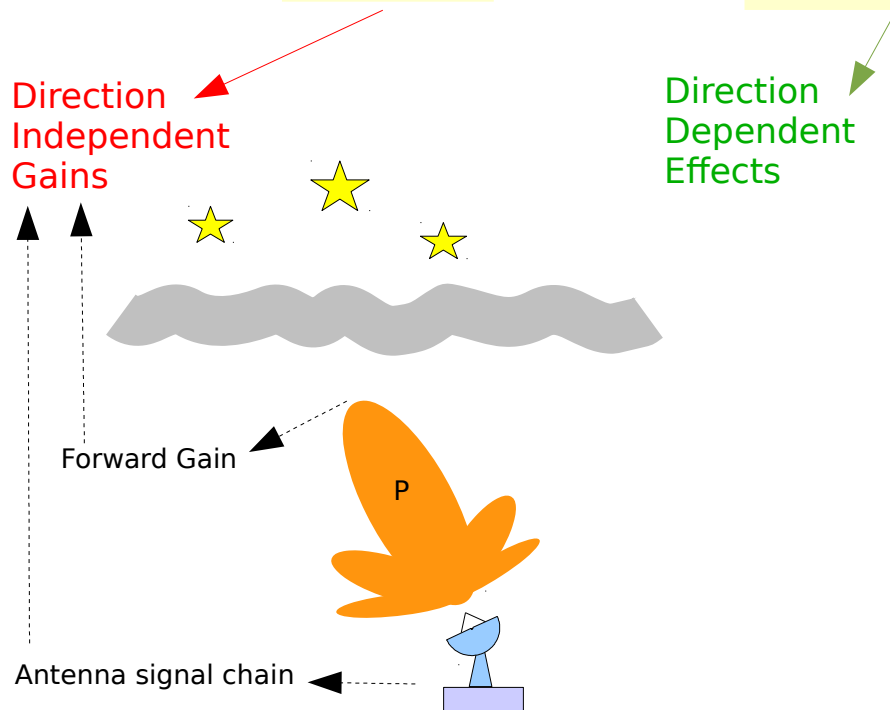
Direction  
Independent  
Gains

Direction  
Dependent  
Effects



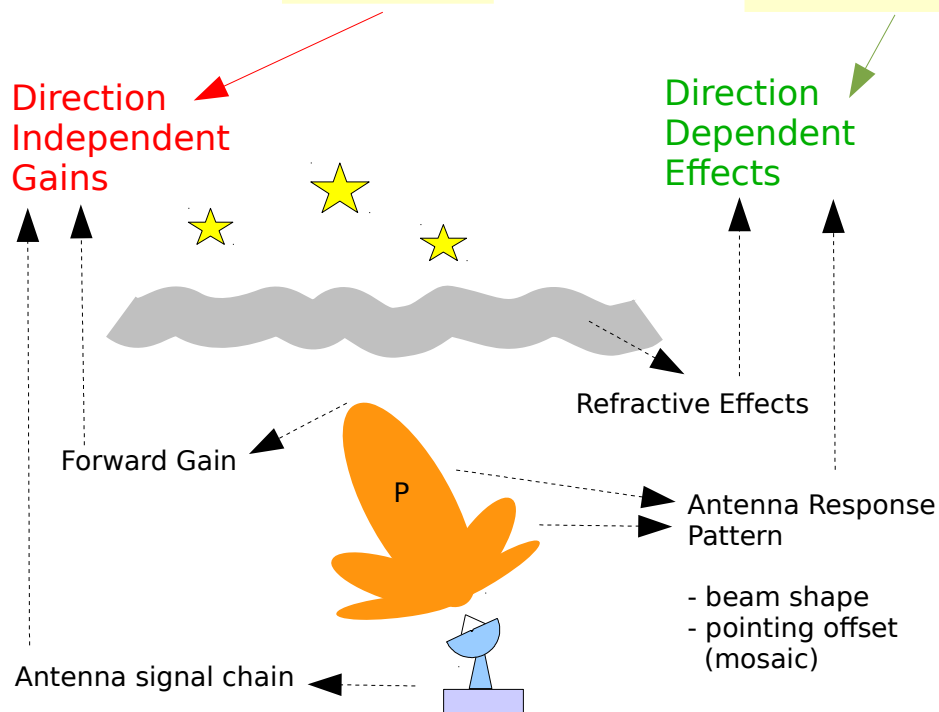
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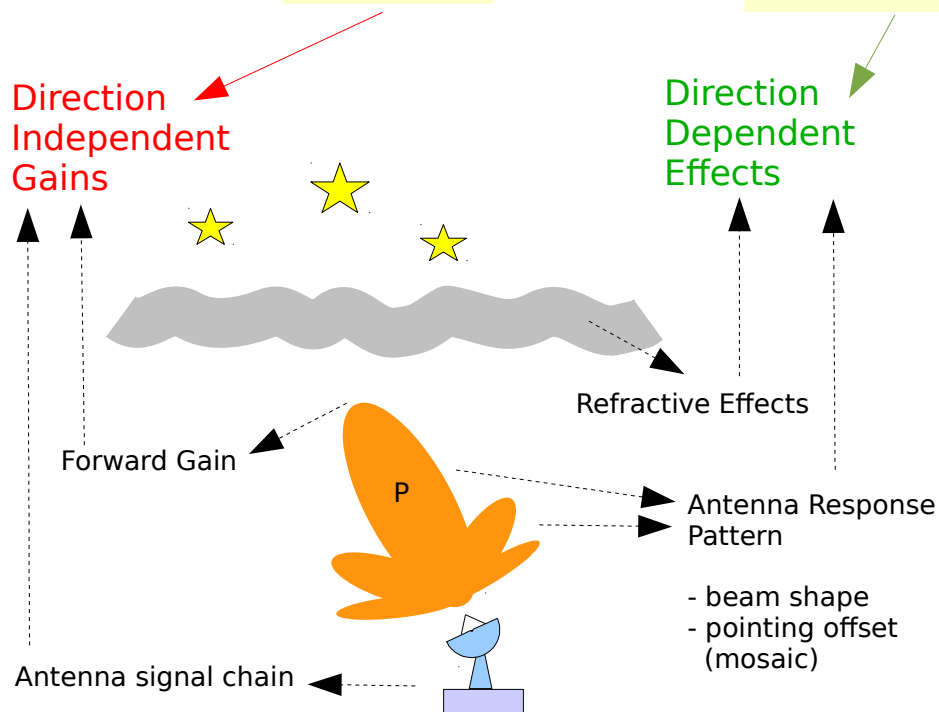
# Wide-Field Imaging : Direction dependent effects

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



# Wide-Field Imaging : Calibration + Imaging

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



**On-axis gains : Calibration**

**Off-axis effects :** Use primary-beam or aperture models in **Imaging**

What models ?

- Theoretical, or measured+fitted (ray-traced, holography, ionosphere maps)

(or)

- Solve for DD gains or PB model params from the data themselves (direction-dependent calibration)

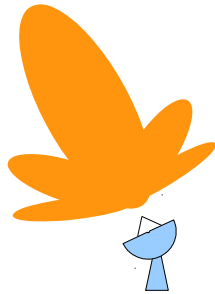
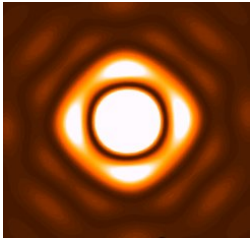
# Primary Beams

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

Direction  
Dependent  
Effects

$$M_{ij} = P_{ij}$$

Primary Beam  
for baseline ij





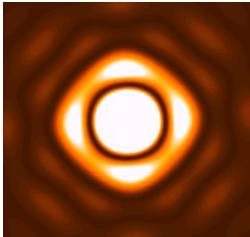
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Direction  
Dependent  
Effects

$$M_{ij} = P_{ij}$$

Primary Beam  
for baseline ij



The Sky is multiplied by a Primary Beam,  
**before** being sampled by each baseline

$$I^{obs}(l, m) = \sum_{ij, t, \nu} I_{ij}^{PSF}(l, m, t, \nu) * [P_{ij}(l, m, t, \nu) \cdot I^{sky}(l, m)]$$

=> No longer a simple convolution equation

# Image-domain Primary Beam Correction (pbcor)

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

Direction  
Dependent  
Effects

Assume identical and invariant primary beams.

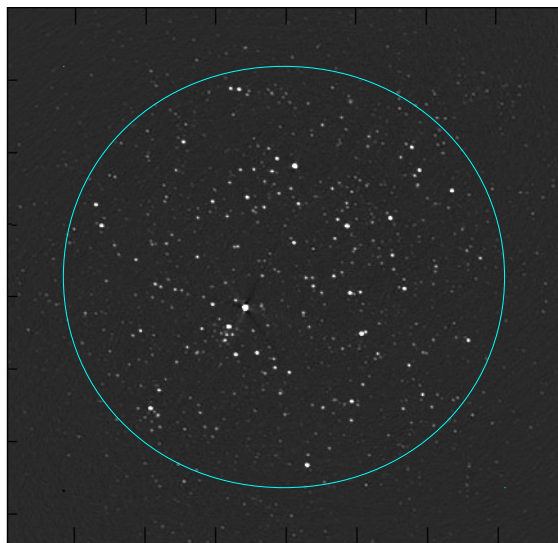
$$I^{obs} = I^{psf} * [P \cdot I^{sky}]$$

Divide out an average primary beam model after deconvolution

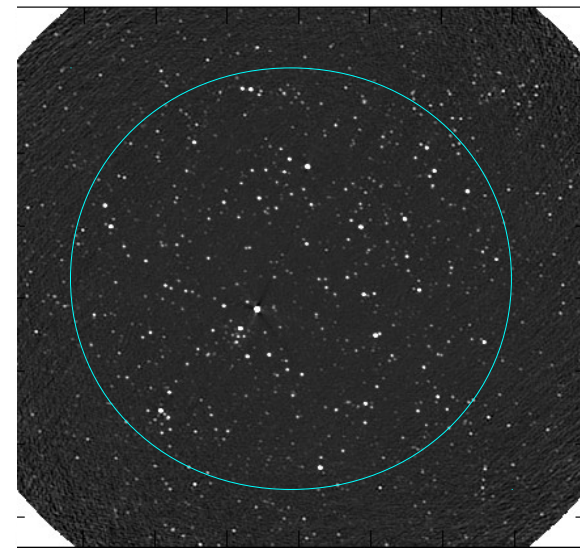
This is approximate

=> Dynamic range limits...

Output Image = PB x Sky



PB-corrected Image : Sky



# A-Projection : Apply correction in UV-domain

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

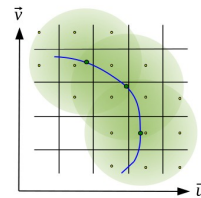
Direction  
Dependent  
Effects

When primary beams change across baseline, time, freq....

$$I_{ij}^{obs} = I_{ij}^{psf} * [P_{ij} \cdot I^{sky}] \quad \longleftrightarrow \quad V_{ij}^{obs} = S_{ij} \cdot [A_{ij} * V^{sky}]$$

For each visibility, apply  $A_{ij}^{-1} \approx \frac{A_{ij}^T}{A_{ij}^T * A_{ij}}$

Use  $A_{ij}^T$  as the convolution function during **gridding**



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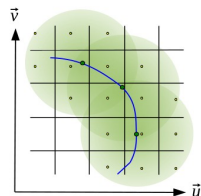
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Aperture Illumination for antennas i and j :

$$P_{ij} = E_i \cdot E_j^* = FT[A_i * A_j^*] = FT[A_{ij}]$$

$$A_{ij} = \text{[Diagram of two overlapping circular apertures with a central crosshair, representing the convolution of two primary beams.]}$$

Ray-traced Model  
(or) Zernicke fits to  
holography data

# A-Projection : Apply correction in UV-domain

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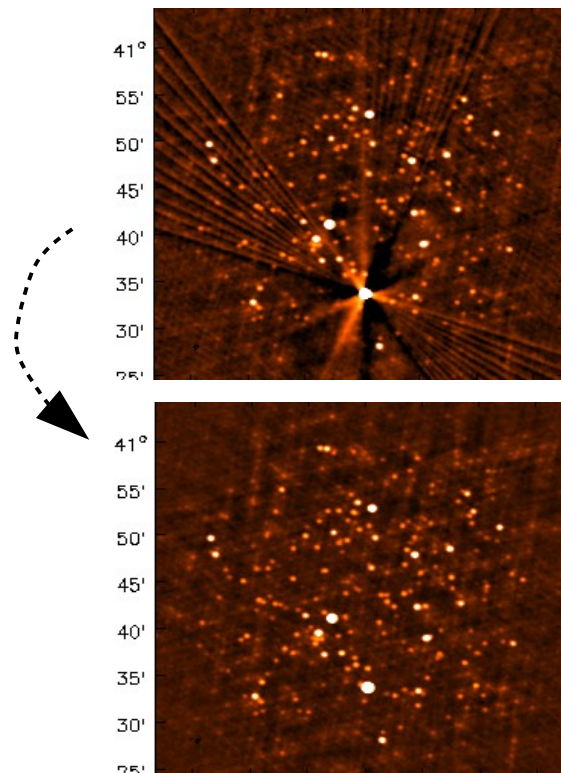
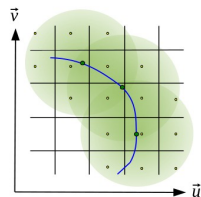
Direction  
Dependent  
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When primary beams change across baseline, time, freq....

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Use  $A_{ij}^T$  as the convolution function during **gridding**

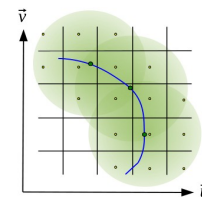


# Mosaicking via A-Projection

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

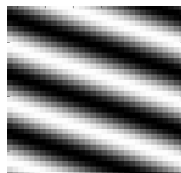
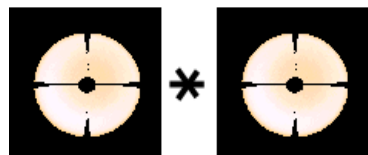
Direction  
Dependent  
Effects

**A-Projection** : Use aperture illumination functions to construct gridding convolution functions.



Use  $A_{ij}^T$  as the convolution function

Add a phase gradient



FT => Primary Beam

FT => Shift the Primary Beam

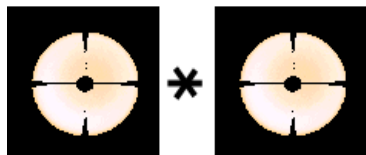
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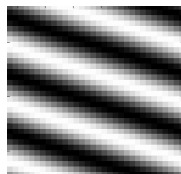
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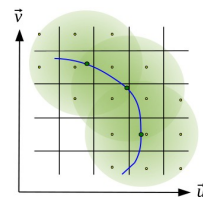


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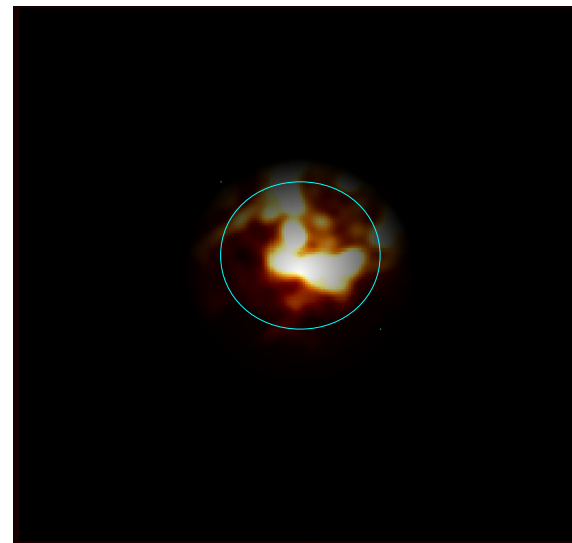
Add a phase gradient



FT => Shift the Primary Beam



Each pointing is gridded with a *different* phase gradient => shift the PB



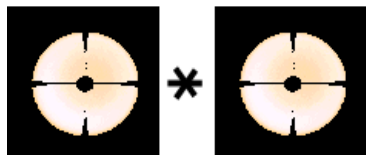
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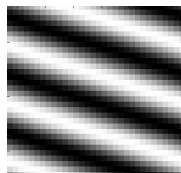
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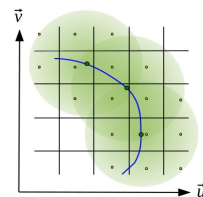


FT => Primary Beam

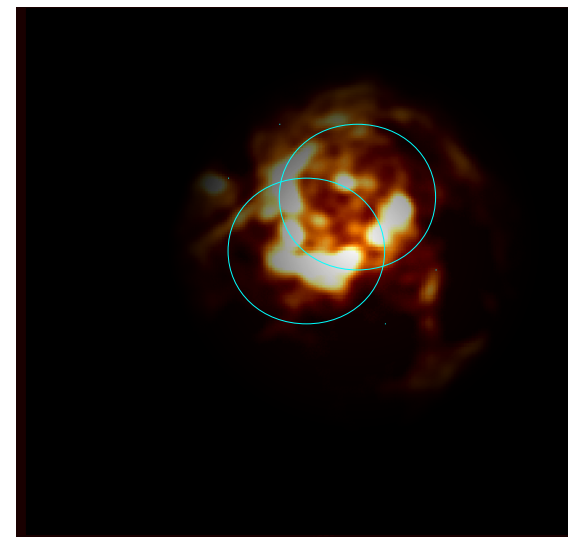
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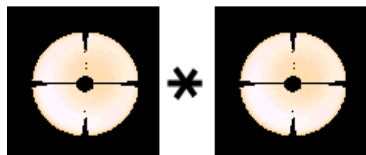
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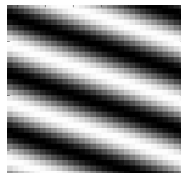
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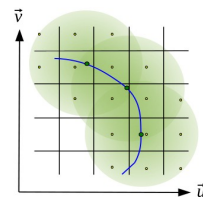


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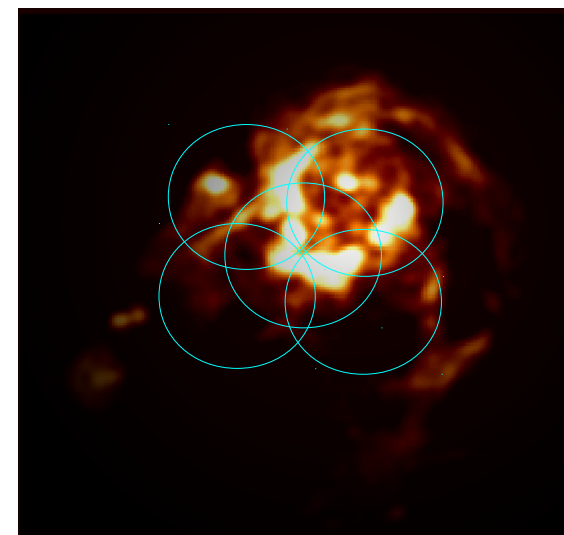
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# Polarization : Full-Mueller A-Projection

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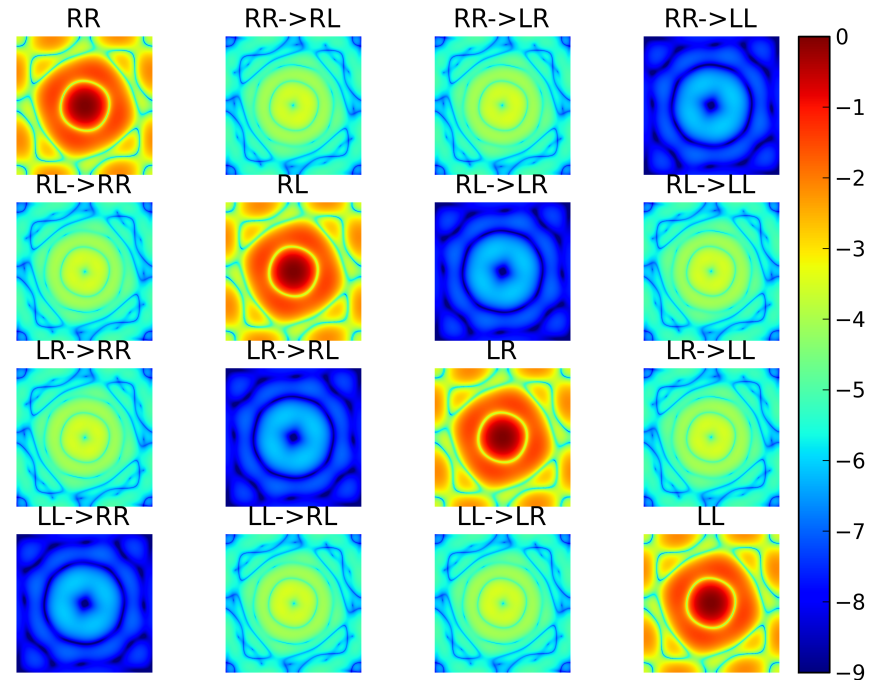
Direction  
Dependent  
Effects

## Full polarization primary beams

- Needed for IQUV imaging over the full PB
- Account for direction-dependent Polarization leakage.

Full-Mueller A-Projection applies the conjugate transpose of the full matrix

=>  $A_{ij}^T$  is a 4x4 matrix application



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Direction  
Independent  
Gains

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency and time

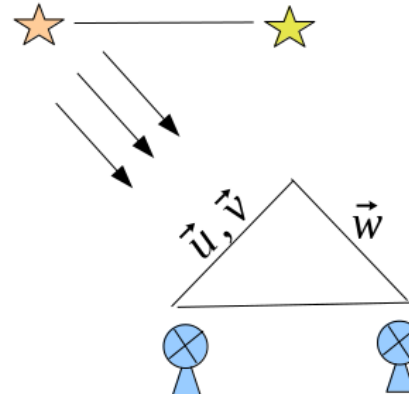
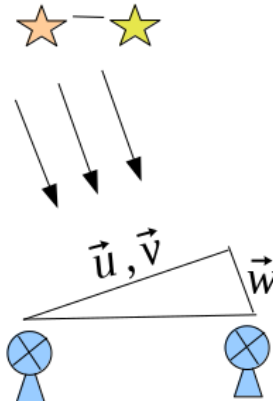
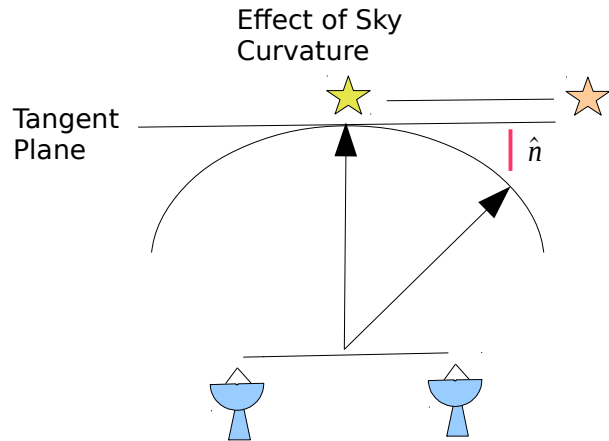
W-Term

**W-Term effect...**

# Wide-Field Imaging : Non-coplanar baselines / W-term

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

W-Term



A known geometric effect

## Algorithms

3D Imaging,  
W-stacking,  
Faceting,  
W-Projection

For a field-of-view given by the Primary Beam of an antenna of diameter  $D$ , at wavelength  $\lambda$  and with a maximum baseline length of  $B$ ....

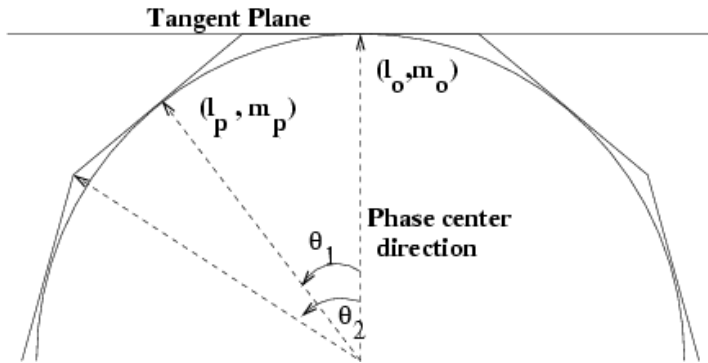
The w-term becomes relevant if  $\frac{\lambda B}{D^2} > 1$

See R.Perley's talks

# W-term : Faceting

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

W-Term



- Approximate the celestial sphere by a set of tangent planes (facets) such that 2D geometry is valid per facet
- Image each facet with its own phase reference center and re-project to the tangent plane

Algorithm Variants:

Deconvolve facets separately before re-projecting and stitching

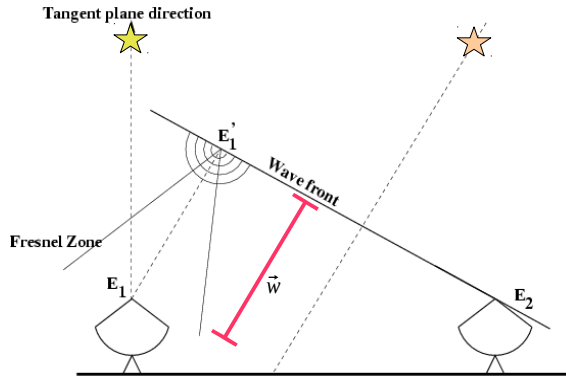
(or)

Image all facets onto the same tangent plane grid and perform a joint deconvolution.

# W-term : W-Projection

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

W-Term



For ideal 2D imaging we need to measure  $E_1$   
 Instead, we measure  $E_1'$

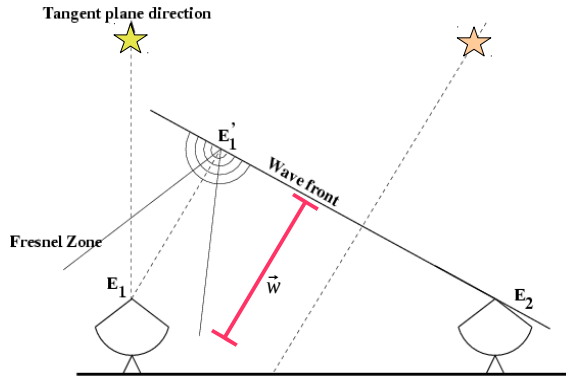
$E_1'$  and  $E_1$  are related by a Fresnel  
 diffraction/propagation kernel.

$$G(u, v, w) = FT \left[ e^{2\pi i w \sqrt{1-l^2-m^2}} \right]$$

# W-term : W-Projection

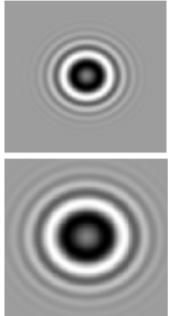
$$V_{ij}^{obs}(\mathbf{v}, t) = M_{ij}(\mathbf{v}, t) S_{ij}(\mathbf{v}, t) \iiint M_{ij}^s(l, m, \mathbf{v}, t) I(l, m, \mathbf{v}, t) e^{2\pi i (ul + vm + w(n-1))} dl dm dn$$

W-Term



W-term appears as a convolution in the UV-domain

$$V^o(u, v, w) = V(u, v, w=0) * G(u, v, w)$$



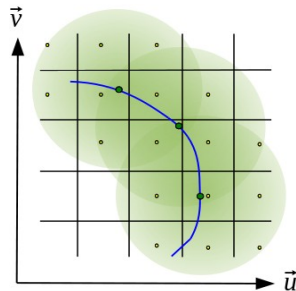
For ideal 2D imaging we need to measure  $E_1$   
Instead, we measure  $E_1'$

$E_1'$  and  $E_1$  are related by a Fresnel diffraction/propagation kernel.

$$G(u, v, w) = FT \left[ e^{2\pi i w \sqrt{1-l^2-m^2}} \right]$$

=> Correct it by another convolution with the inverse/conjugate kernel (during the gridding step)

=> Use different kernels for different W values (appropriately quantized)

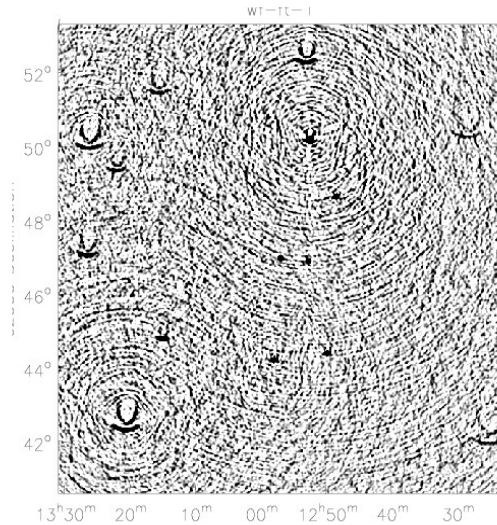


# W-Term : Algorithm Comparison

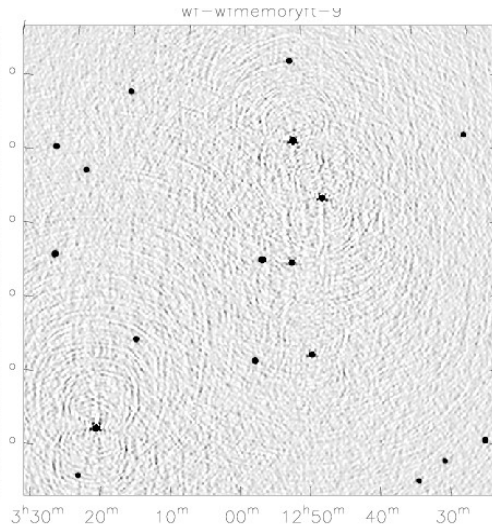
$$V_{ij}^{obs}(\mathbf{v}, t) = M_{ij}(\mathbf{v}, t) S_{ij}(\mathbf{v}, t) \iiint M_{ij}^s(l, m, \mathbf{v}, t) I(l, m, \mathbf{v}, t) e^{2\pi i(ul+vm+w(n-1))} dl dm dn$$

W-Term

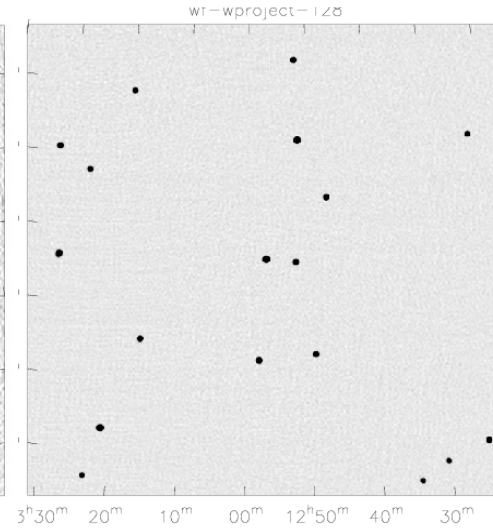
2D Imaging



Facet Imaging



W-Projection





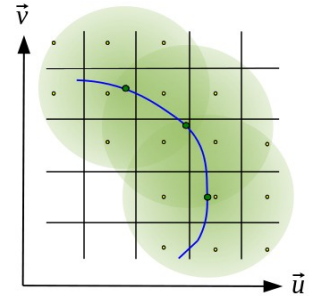
# Correcting all Direction Dependent effects together.....

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

Direction  
Dependent  
Effects

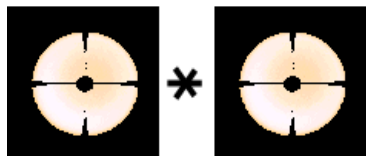
W-Term

**A-W-Projection** : Correct multiple Direction Dependent effects together, during gridding



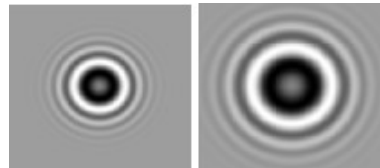
The gridding convolution function (per visibility) is a combination of the following.....

Aperture illumination  
functions ( ij, time, freq, pol )



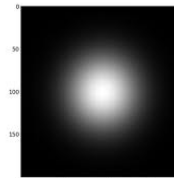
Primary Beams

FT of Fresnel kernels



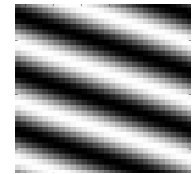
W-term effects

Prolate  
Spheroidal



Anti-Aliasing Filter

Phase  
gradient



Mosaic

# Radio Interferometry – Measurement Equations

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

Direction  
Independent  
Gains

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency and time

W-Term

**Wide-Band Effects.....**

# Wide-Band Imaging

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

UV sampling  
function

Primary Beam varies  
with frequency

Sky-brightness varies  
with frequency

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%

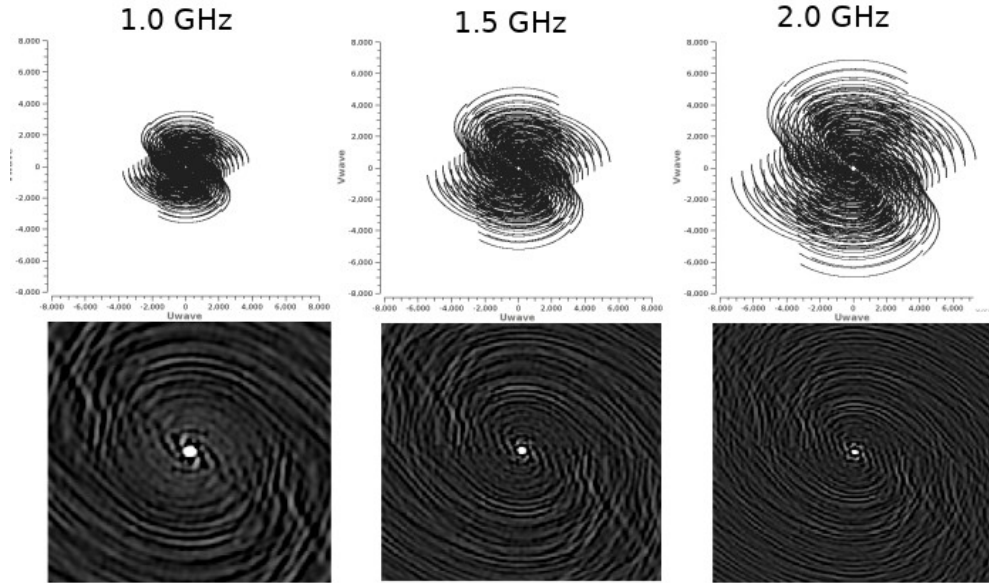
+ Imaging sensitivity improves with increased bandwidth

- Frequency dependent effects (sky and instrument) are stronger with increased bandwidth

# Multi-Frequency Synthesis

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

UV sampling  
function

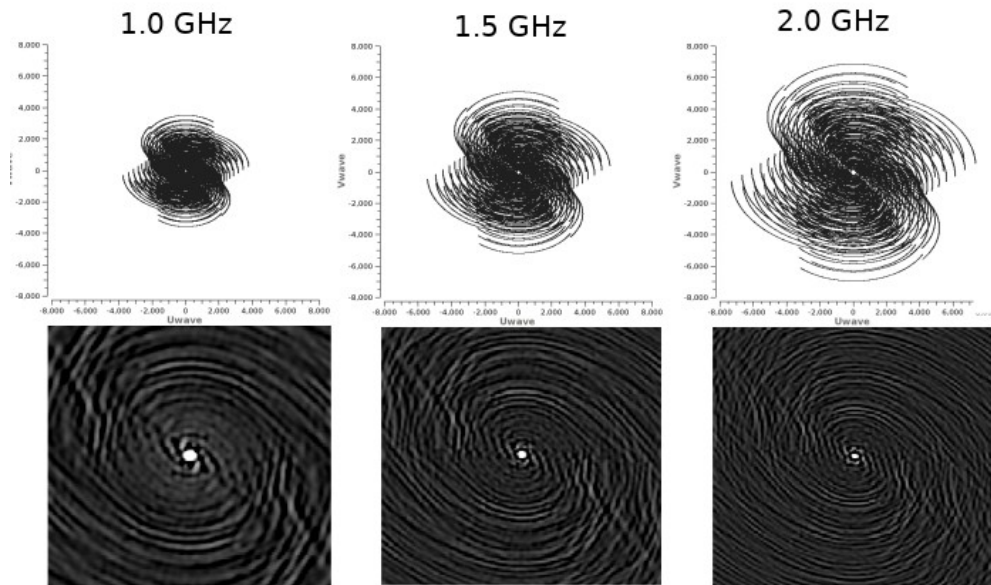


Observed image :  $I_{\nu}^{obs} = I_{\nu}^{sky} * PSF_{\nu}$

# Multi-Frequency Synthesis

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

UV sampling function

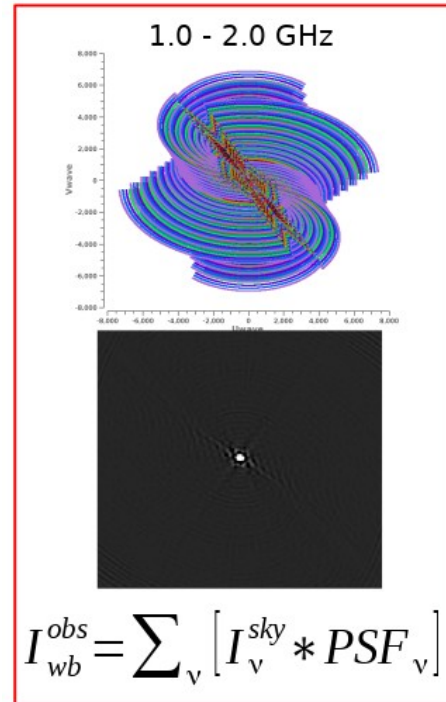


Observed image :  $I_{\nu}^{obs} = I_{\nu}^{sky} * PSF_{\nu}$

## Multi-Frequency Synthesis

Combine data from multiple channels

- Improve PSF
- Improve SNR

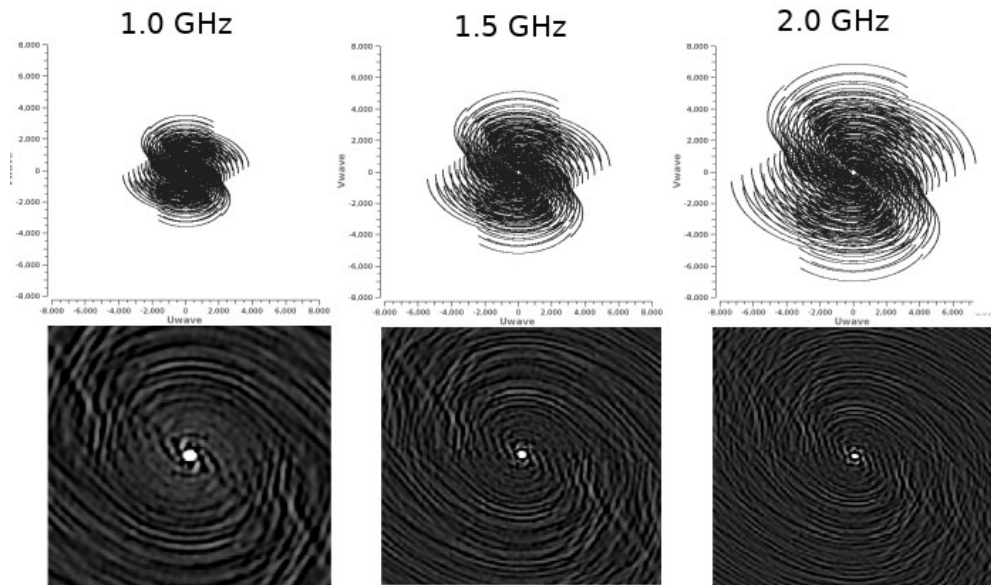


# Multi-Frequency Synthesis

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

UV sampling function

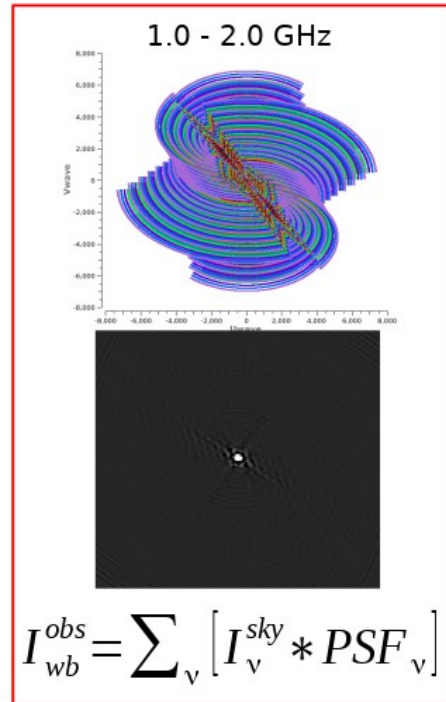
Sky-brightness varies with frequency



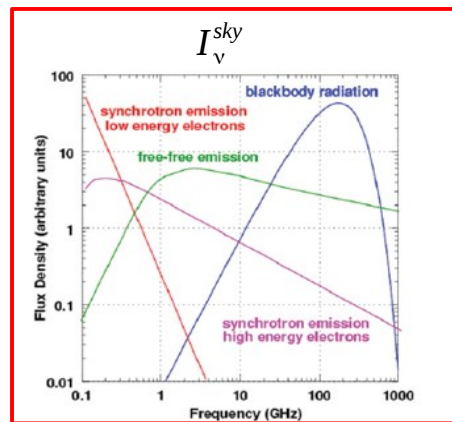
## Multi-Frequency Synthesis

Combine data from multiple channels

- Improve PSF
- Improve SNR



Observed image :  $I_{\nu}^{obs} = I_{\nu}^{sky} * PSF_{\nu}$



# Wide-band Deconvolution

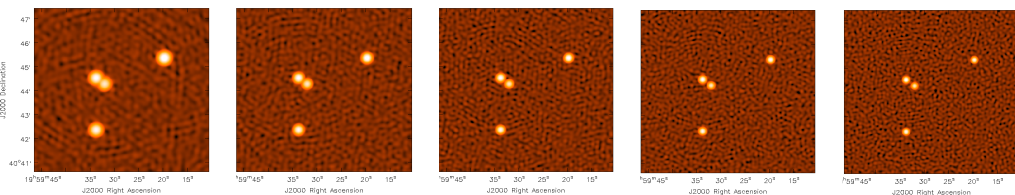
$$V_{ij}^{obs}(\nu, t) = M_{ij}(\nu, t) S_{ij}(\nu, t) \iiint M_{ij}^s(l, m, \nu, t) I(l, m, \nu, t) e^{2\pi i(ul + vm + w(n-1))} dl dm dn$$

UV sampling  
function

Sky-brightness varies  
with frequency

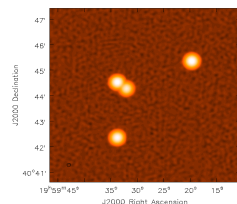
## Cube Imaging :

- (1) Reconstruct each chan/spw separately
- (2) Smooth to the lowest available resolution
- (3) Combine to calculate continuum and spectra



Continuum image

(sum of smoothed  
channel maps)



# Wide-band Deconvolution

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

UV sampling function

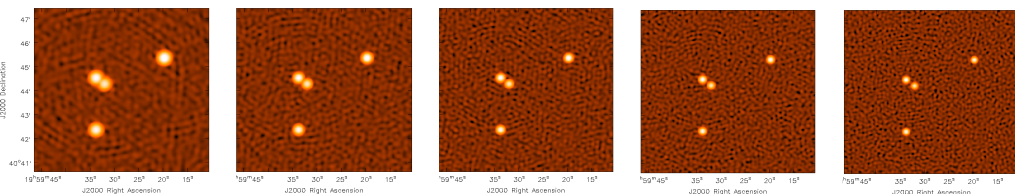
Sky-brightness varies with frequency

## Cube Imaging :

- (1) Reconstruct each chan/spw separately
- (2) Smooth to the lowest available resolution
- (3) Combine to calculate continuum and spectra

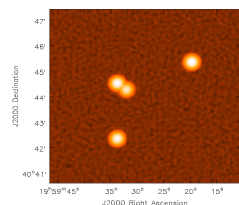
## Multi-Frequency-Synthesis (MFS) :

Combine data from all frequencies and do a joint reconstruction



Continuum image

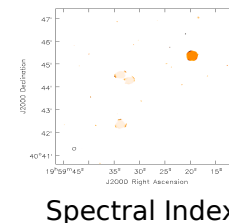
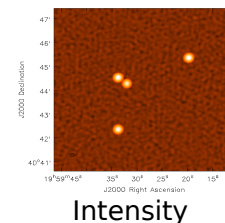
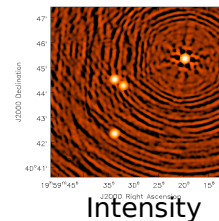
(sum of smoothed channel maps)



Flat-spectrum assumption

Model intensity and spectrum together :

$$I_{\mathbf{v}}^{sky} = \sum_t I_t^m \left( \frac{\mathbf{v} - \mathbf{v}_0}{v_0} \right)^t$$

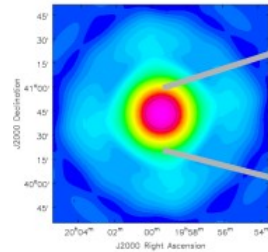
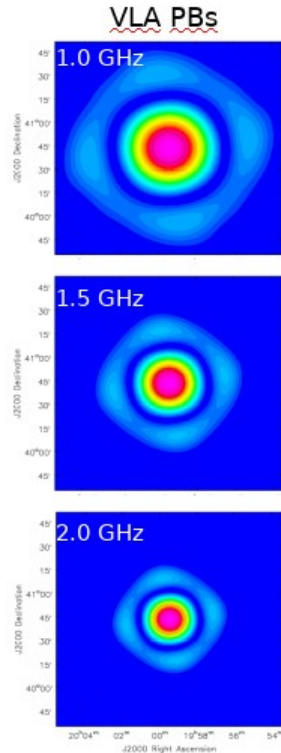




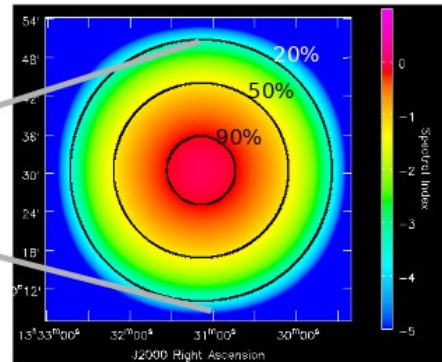
# Wide Band + Wide Field : Frequency-dependent Primary Beams

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

Primary Beam varies with frequency



Average PBs



Spectral Index of PB

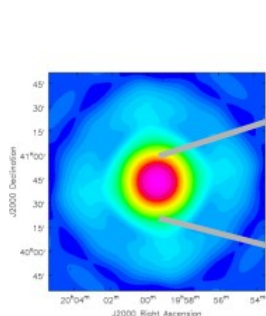
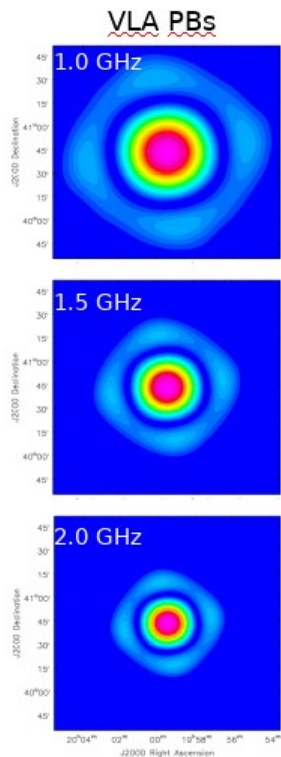
(About -1.4 at the HPBW)

$$I_{wf,wb}^{obs} = \sum_{\nu} \left[ \left( P_{\nu} \cdot I_{\nu}^{sky} \right) * PSF_{\nu} \right]$$

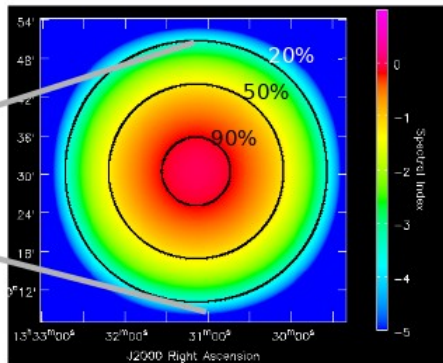
# Wide Band + Wide Field : Frequency-dependent Primary Beams

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

Primary Beam varies with frequency



Average PBs



Spectral Index of PB

(About -1.4 at the HPBW)

$$I_{wf,wb}^{obs} = \sum_{\nu} \left[ \left( P_{\nu} \cdot I_{\nu}^{sky} \right) * PSF_{\nu} \right]$$

## 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)

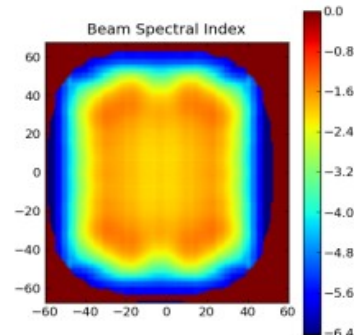
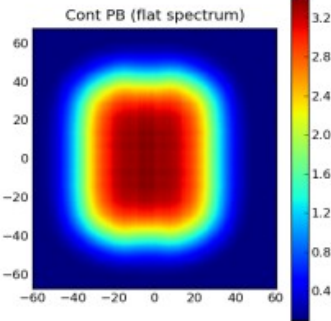
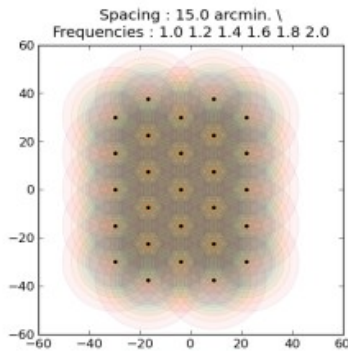
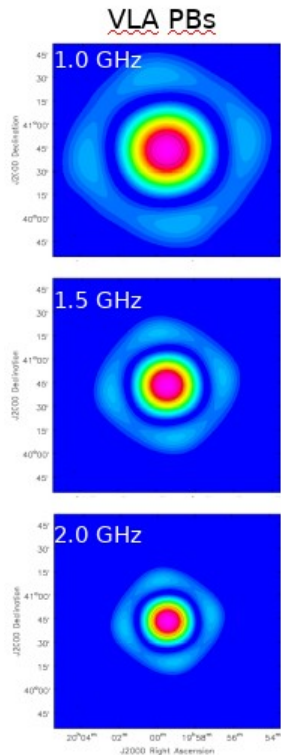
$$A_{\nu}^{-1} \approx \frac{A_{\nu_c}^T}{A_{\nu_c}^T * A_{\nu}} \quad \text{where} \quad P_{\nu} \cdot P_{\nu_c} \approx P_{\nu_{mid}}^2$$

- Output spectral index image represents only the sky

# Wide Band Mosaics

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

Primary Beam varies with frequency



The mosaic primary beam has an artificial spectral index all over the F-O-V

=> There is no part of the mosaic that is free from wideband primary-beam effects.

## Algorithms :

Combinations of.....

- Stitched vs Joint Mosaics
- Cube vs MFS
- PBCor vs A-Projection

Different numerical accuracies and compute costs.

Depends on the sky.

# Radio Interferometry – Measurement Equations

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

Direction  
Independent  
Gains

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency and time

W-Term

**Put it all together.....**

# Radio Interferometry – Measurement Equations

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

Direction  
Independent  
Gains

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency and time

W-Term

**Calibration**

# Radio Interferometry – Measurement Equations

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

Direction  
Independent  
Gains

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency and time

W-Term

**Calibration**

=> Multiplicative effect in the image domain  
=> Convolutions in the visibility domain  
( corrected during gridding + iFFT + normalization )

**Imaging**

# Radio Interferometry – Measurement Equations

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

Direction  
Independent  
Gains

**Calibration**

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency and time

W-Term

**Deconvolution**

Image reconstruction  
( in the image domain )

Cube, Multi-term WB, etc

=> Multiplicative effect in the image domain  
=> Convolutions in the visibility domain  
( corrected during gridding + iFFT + normalization )

**Imaging**

# Radio Interferometry – Measurement Equations

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

Direction Independent Gains

UV sampling function

Direction Dependent Effects

Sky-brightness varies with frequency and time

W-Term

**Calibration**

**Deconvolution**

Image reconstruction  
( in the image domain )

Cube, Multi-term WB, etc

**Self-Calibration**

**Imaging**

=> Multiplicative effect in the image domain  
=> Convolutions in the visibility domain  
( corrected during gridding + iFFT + normalization )

Direction-dependent Self-Cal

Wideband Self-Cal



# Direction-dependent Self-Calibration

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

Direction Independent Gains

UV sampling function

Direction Dependent Effects

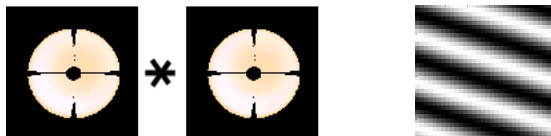
Sky-brightness varies with frequency and time

W-Term

Model the sky and instrument separately

Parameterize the aperture illumination function

- Solve for pointing offsets
- Solve for ionospheric propagation effects



**Algorithms** : Pointing Self-Cal (with A-Proj)

Model the sky and instrument together

Joint solutions for gains in multiple directions

- Does not use a known PB model
- Difficult to get accurate source flux
- Good approach for source-subtraction

**Algorithms** : DD-facets, etc....

# Radio Interferometry – Measurement Equations

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

Direction  
Independent  
Gains

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency and time

W-Term

**How are these algorithms realized in software..... ?**

# Iterative Image Reconstruction

---

**The generalized forward problem**  $V^{obs} = [A] I^m + n$

**The generalized inverse problem**  $I^m = [A]^{-1} V^{obs}$

L2 data regularization

+ Sky model (multiscale, wideband, timevar)

+ Solver/Optimizer with constraints/biases

# Iterative Image Reconstruction

The generalized forward problem  $V^{obs} = [A] I^m + n$

The generalized inverse problem  $I^m = [A]^{-1} V^{obs}$

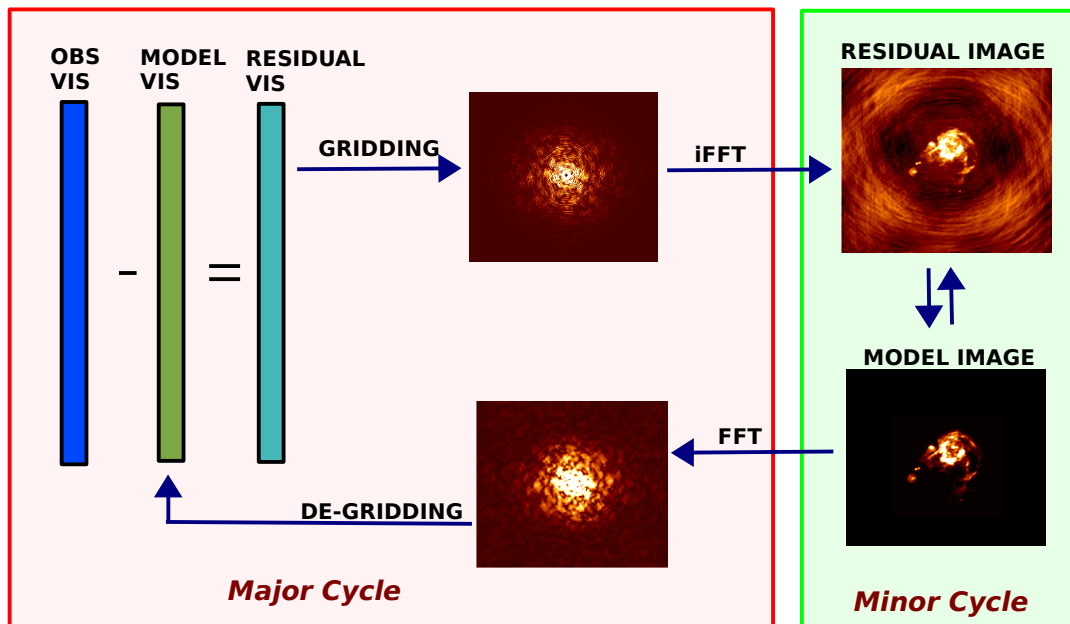
L2 data regularization

+ Sky model (multiscale, wideband, timevar)

+ Solver/Optimizer with constraints/biases

Forward and  
Reverse  
transforms

$$\text{Calc } \frac{\delta \chi^2}{\delta I^m}$$



**Image  
Reconstruction**

Deconvolution  
Algorithms

# Iterative Image Reconstruction

**The generalized forward problem**  $V^{obs} = [A] I^m + n$

L2 data regularization

**The generalized inverse problem**  $I^m = [A]^{-1} V^{obs}$

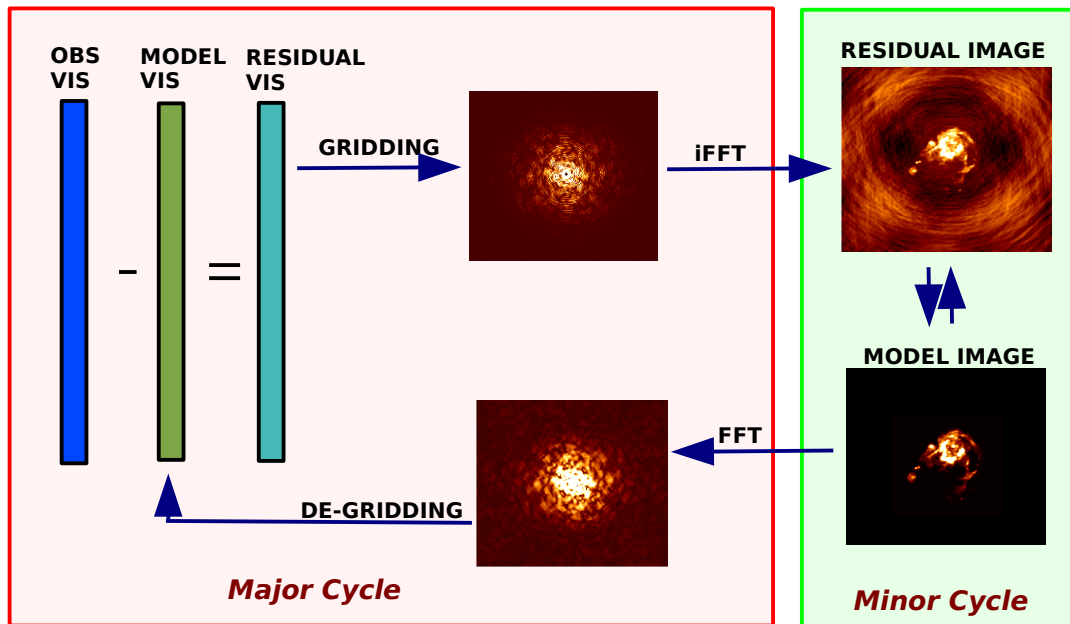
+ Sky model (multiscale, wideband, timevar)  
+ Solver/Optimizer with constraints/biases

## Forward and Reverse transforms

$$\text{Calc } \frac{\delta \chi^2}{\delta I^m}$$

## Gridding Options

- Primary-Beams
- Wideband
- Full Pol
  
- W-Term
- Mosaic



## Image Reconstruction

Deconvolution Algorithms

**Sky models**

- Delta function
- Gaussians
- Wideband

**Algorithms**

- Clean (greedy)
- Many other compressed sensing ideas

**Compute Cost :** Data volume, Image size, N\_channels  
Size of gridding convolution function  
Deconvolution algorithm  
Sky brightness (intensity and structure)

## Some References....

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

Direction  
Independent  
Gains

UV sampling  
function

Direction  
Dependent  
Effects

Sky-brightness varies  
with frequency and time

W-Term

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