



# Observing planet forming disks with ALMA

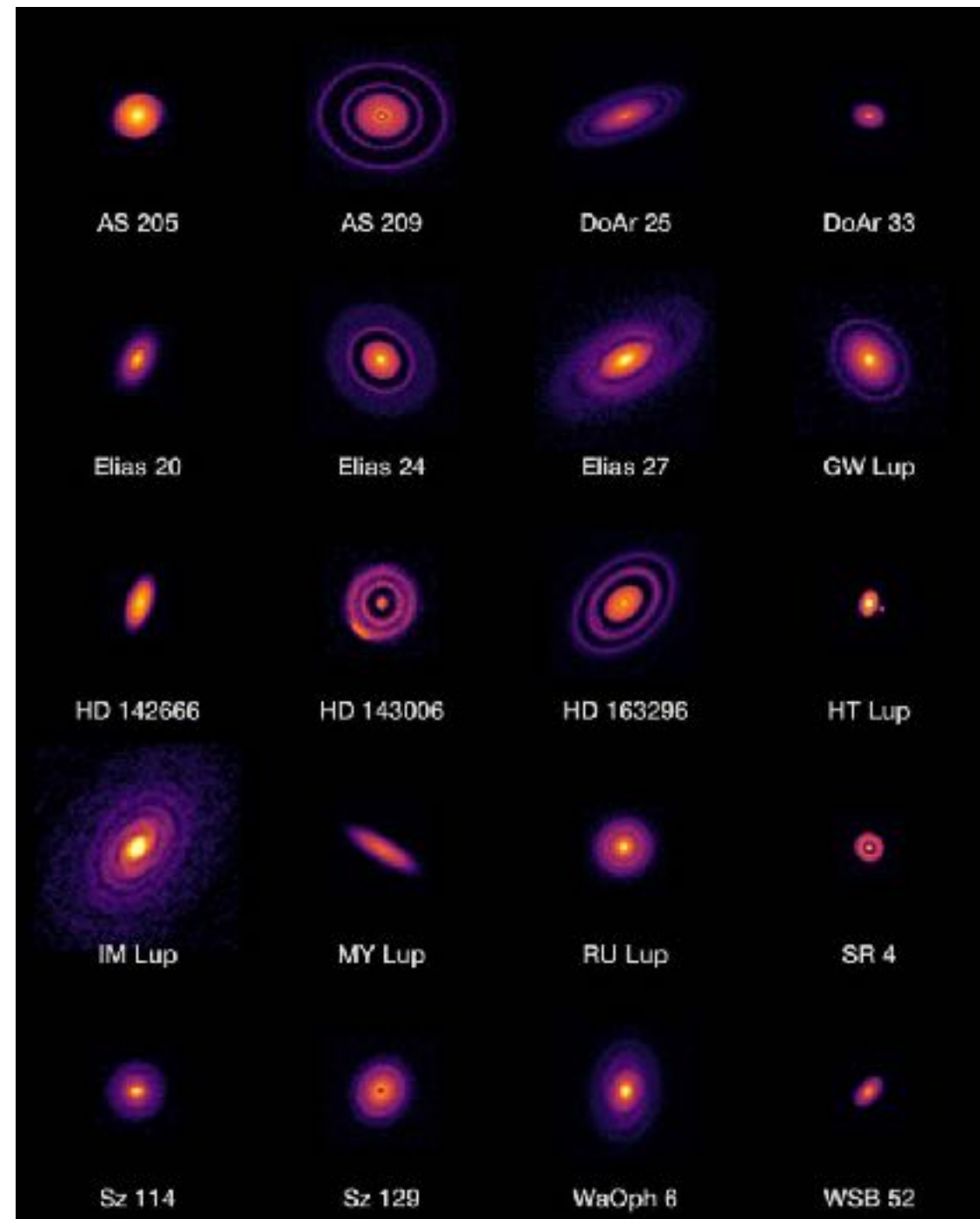
## Basics of interferometry II and disk kinematics

Stefano Facchini

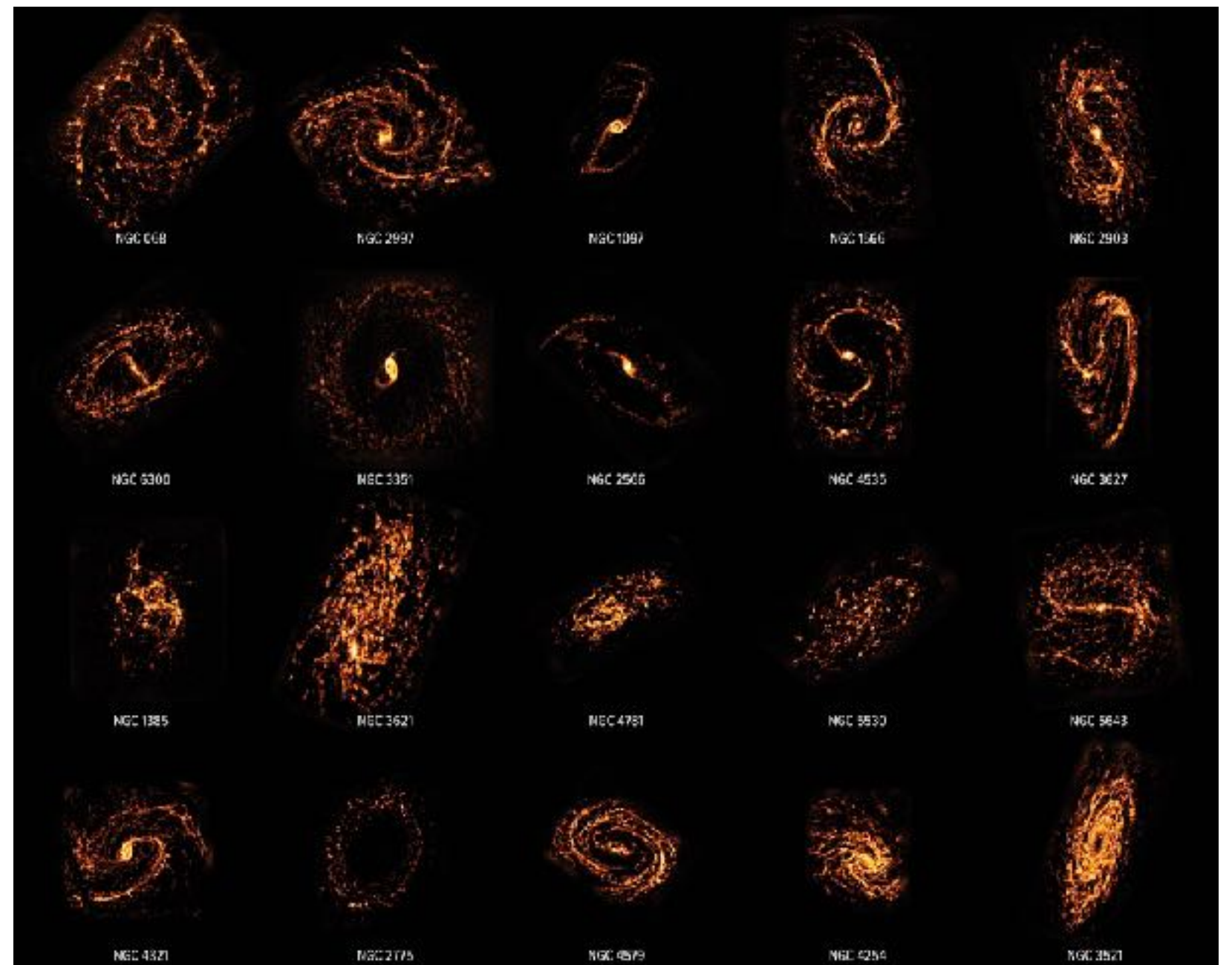


# Image-reconstruction

How to obtain an image after measuring  $V(u,v)$ ?



Andrews+2018

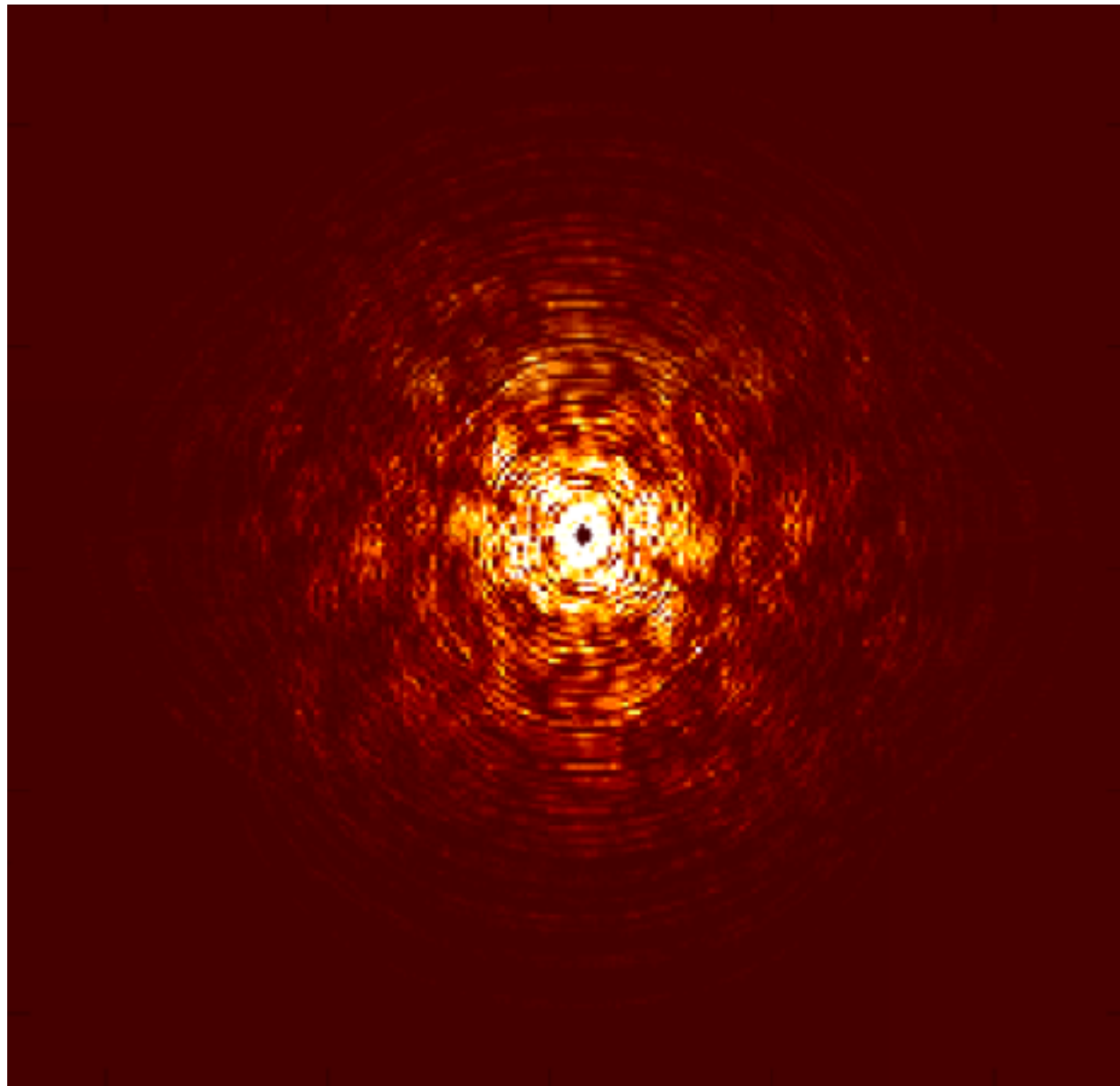


Dagnello+2021

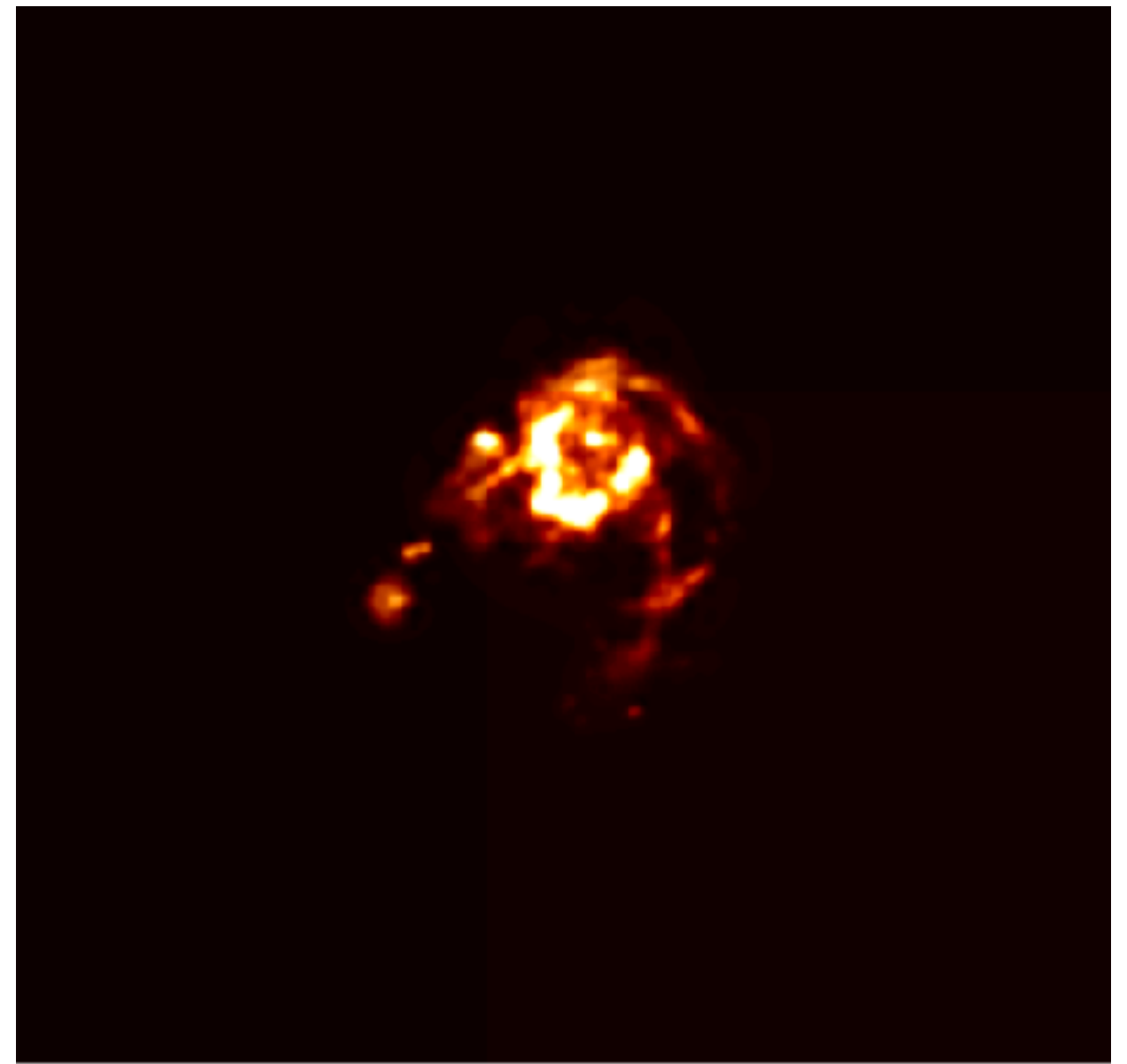
# How to we go from $V(u,v)$ to $I(x,y)$ ?

$$V(u, v) = \int I(x, y) e^{-2\pi i(ux+vy)} dx dy$$

$V(u,v)$

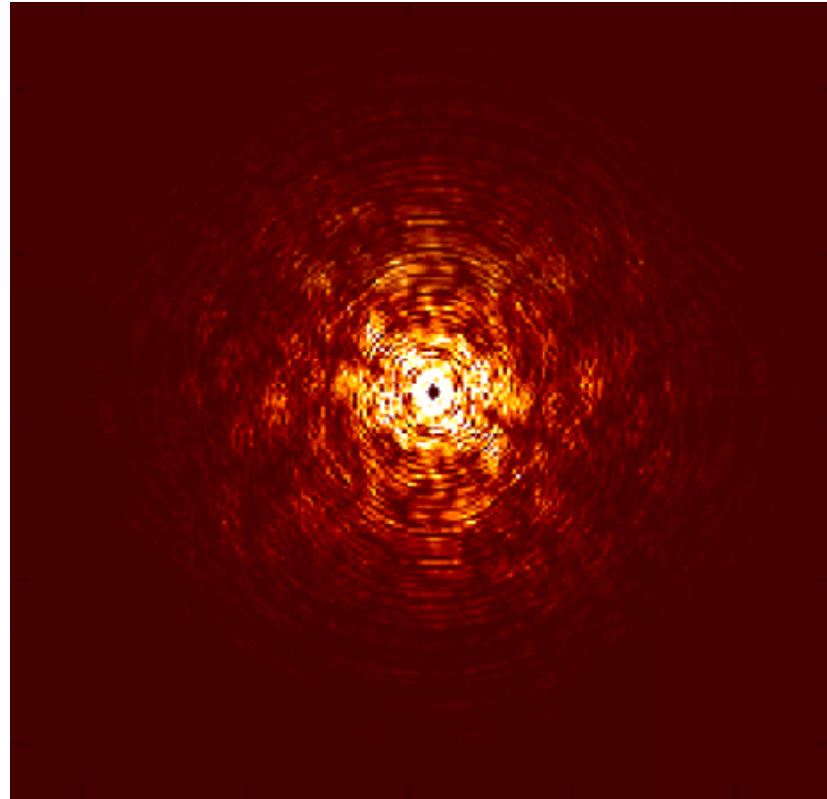


$I(x,y)$

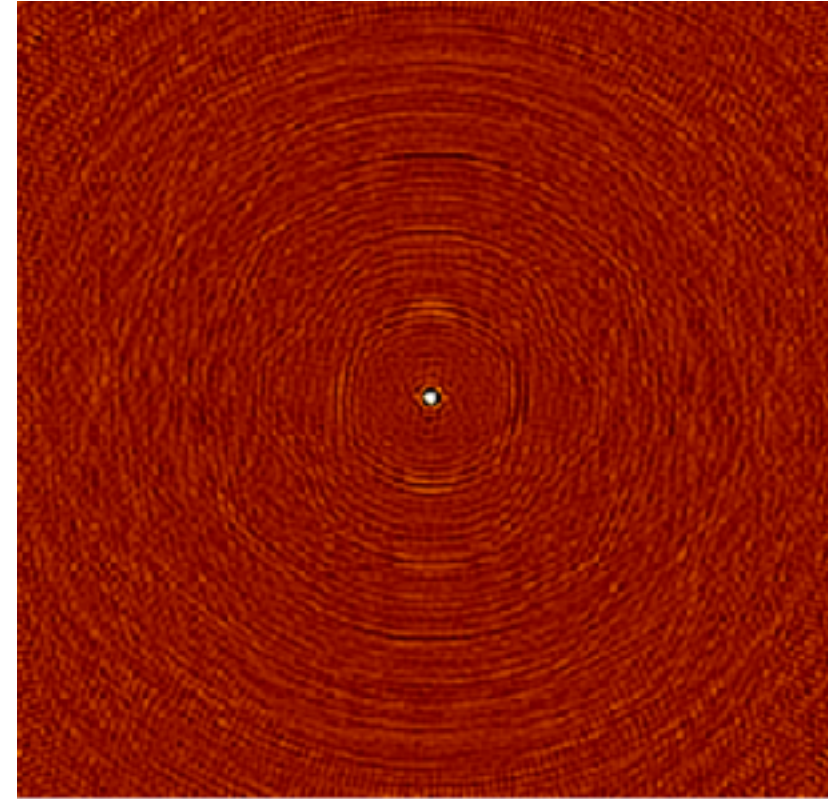


# Some definitions

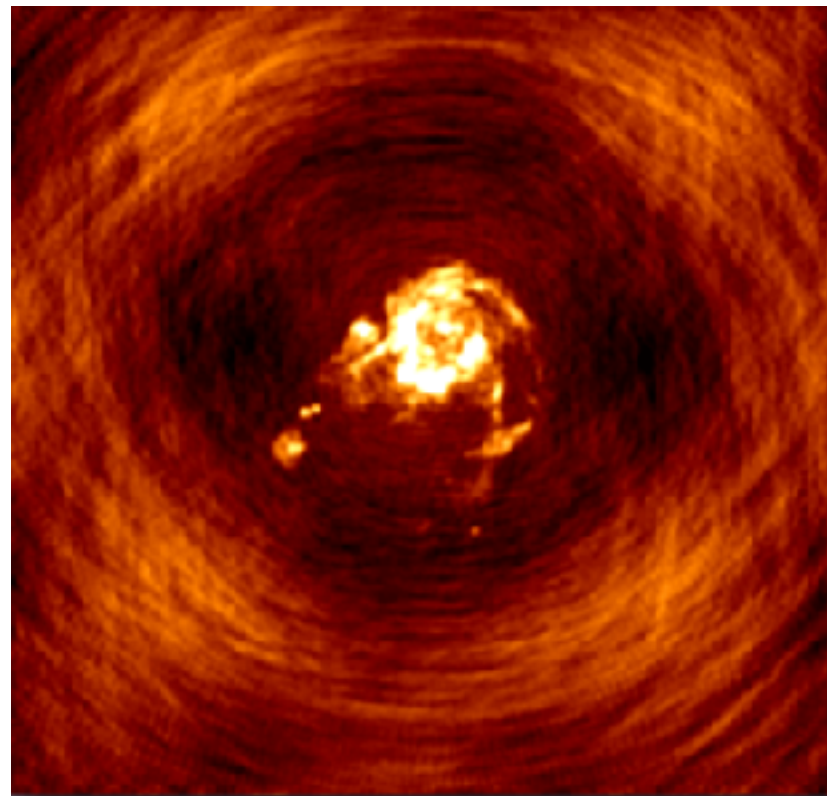
$V(u,v)$   
Visibilities



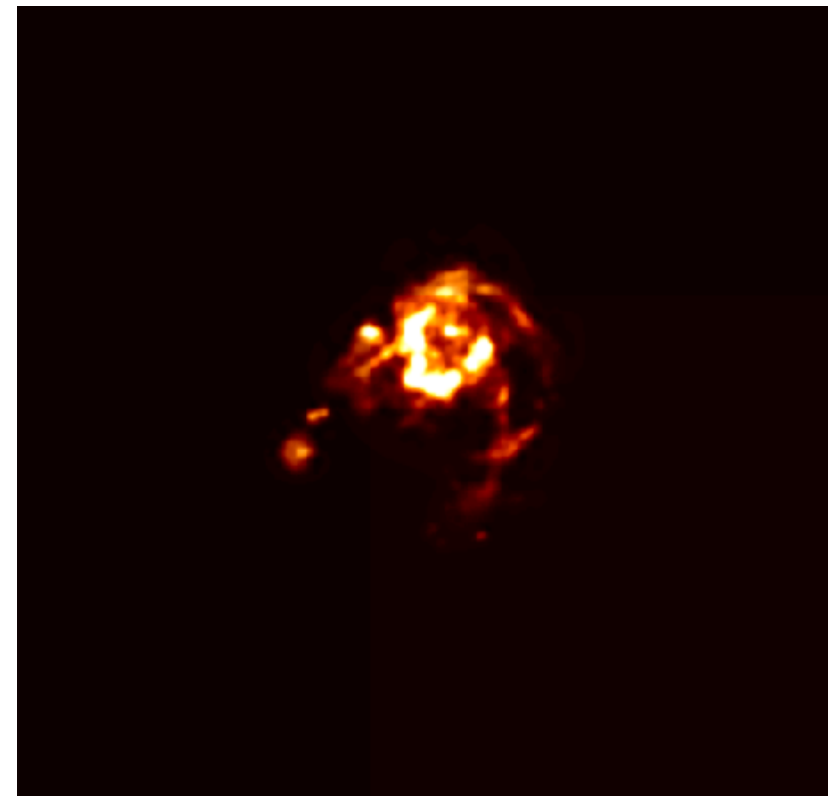
$B_D(x,y)$   
Dirty beam



$I_D(x,y)$   
Dirty image

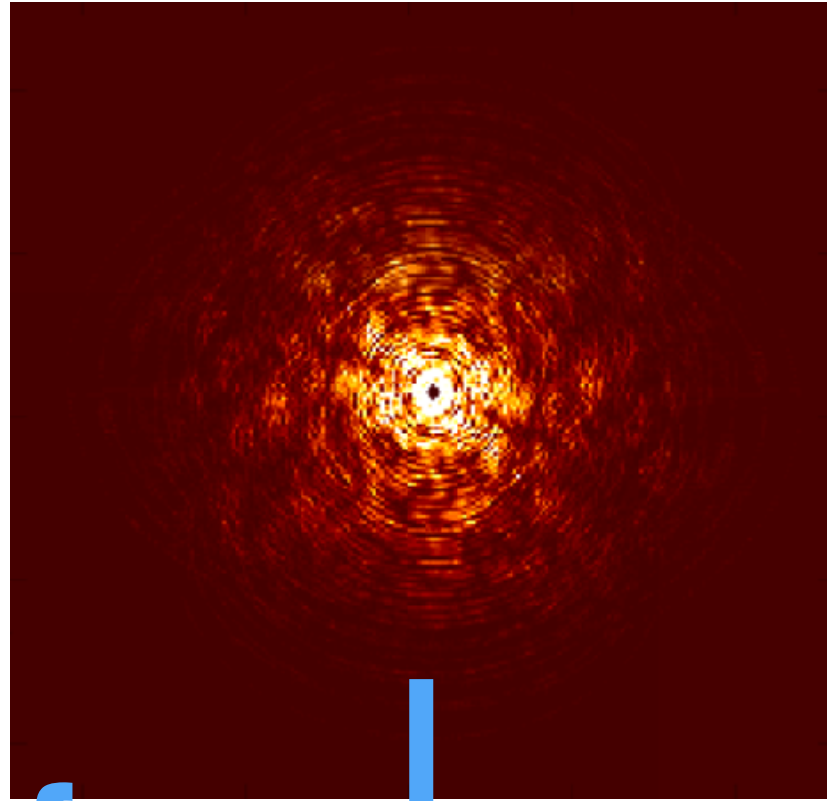


$I(x,y)$   
Image

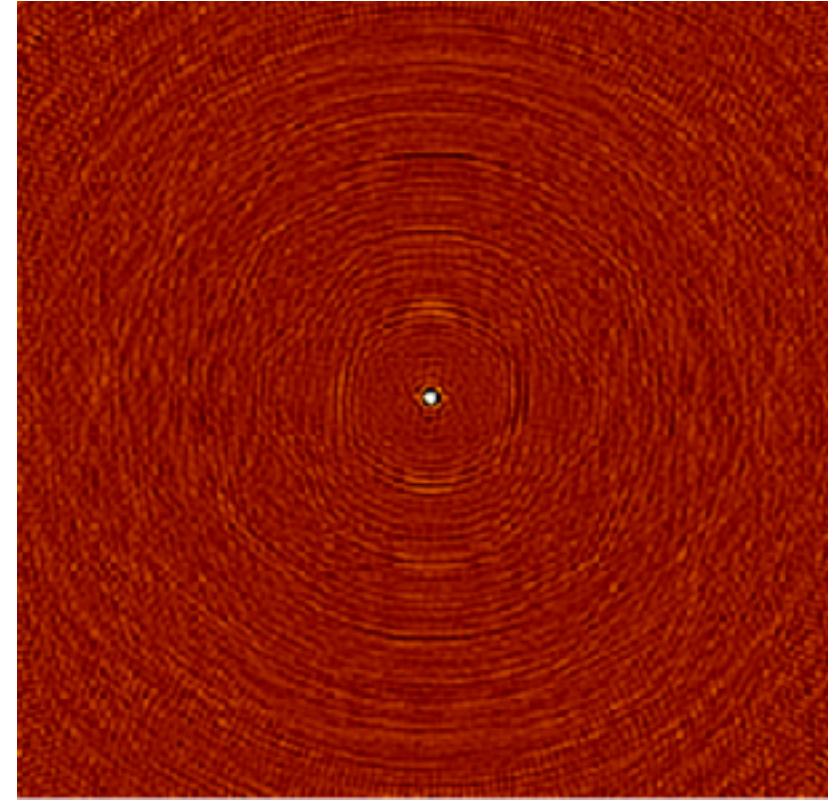


# Nomenclature

$V(u,v)$   
Visibilities



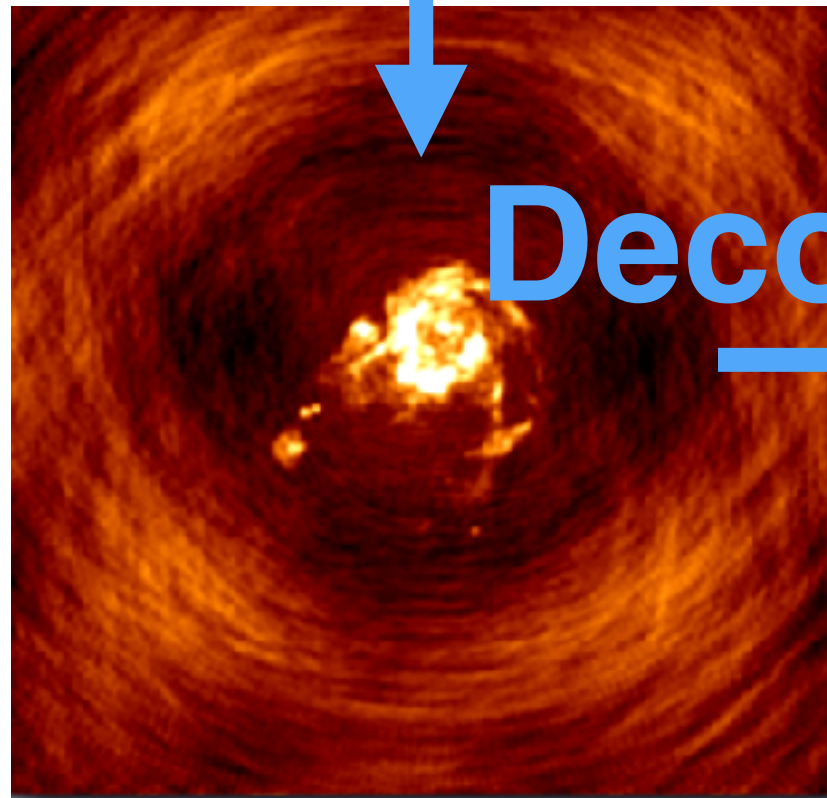
$B(x,y)$   
Dirty beam



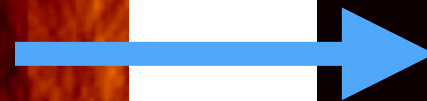
**Transform**



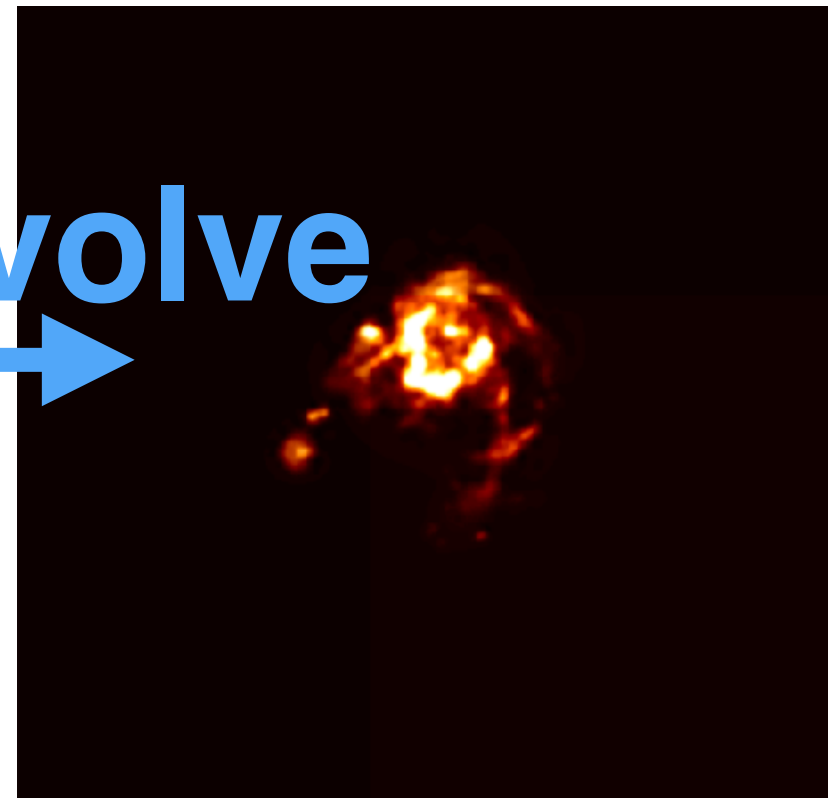
$I_D(x,y)$   
Dirty image



**Deconvolve**



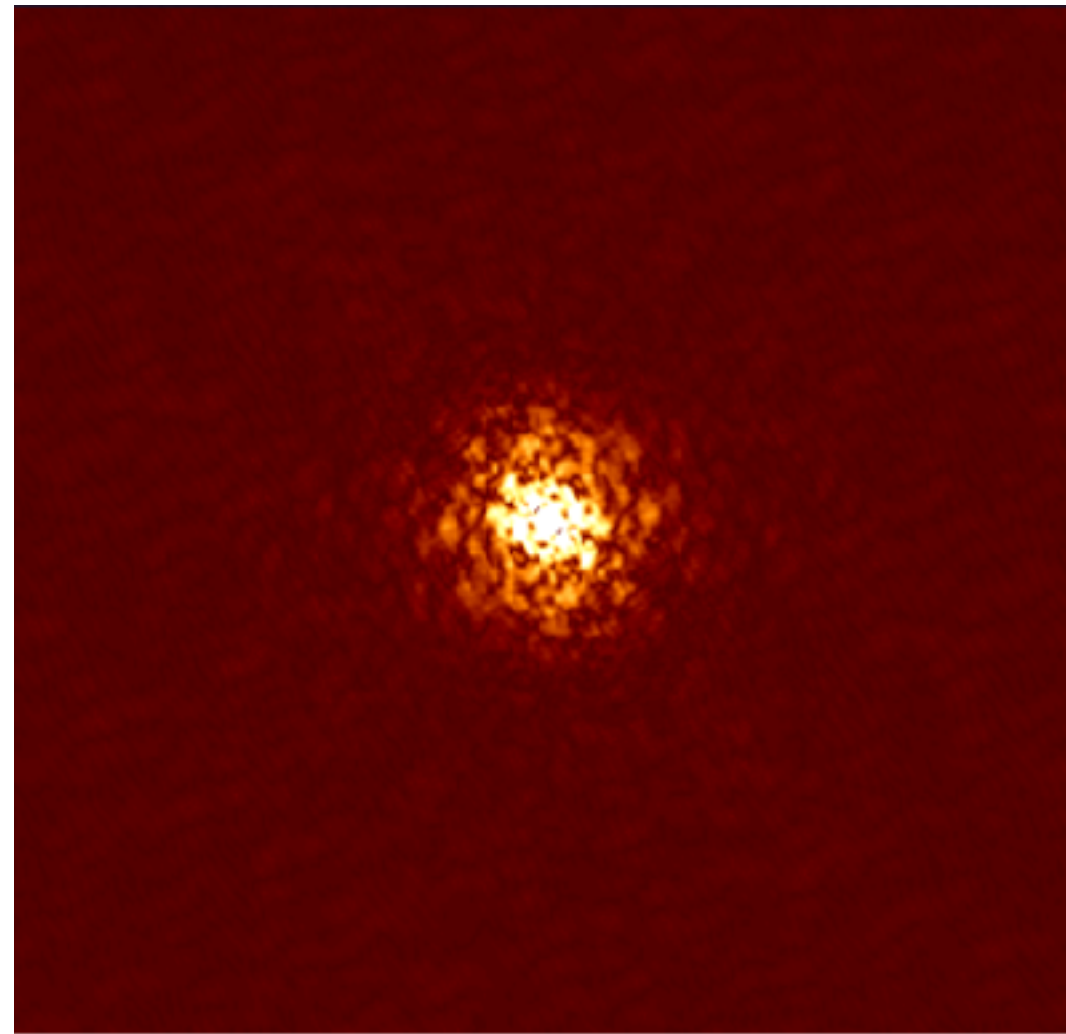
$I(x,y)$   
Image



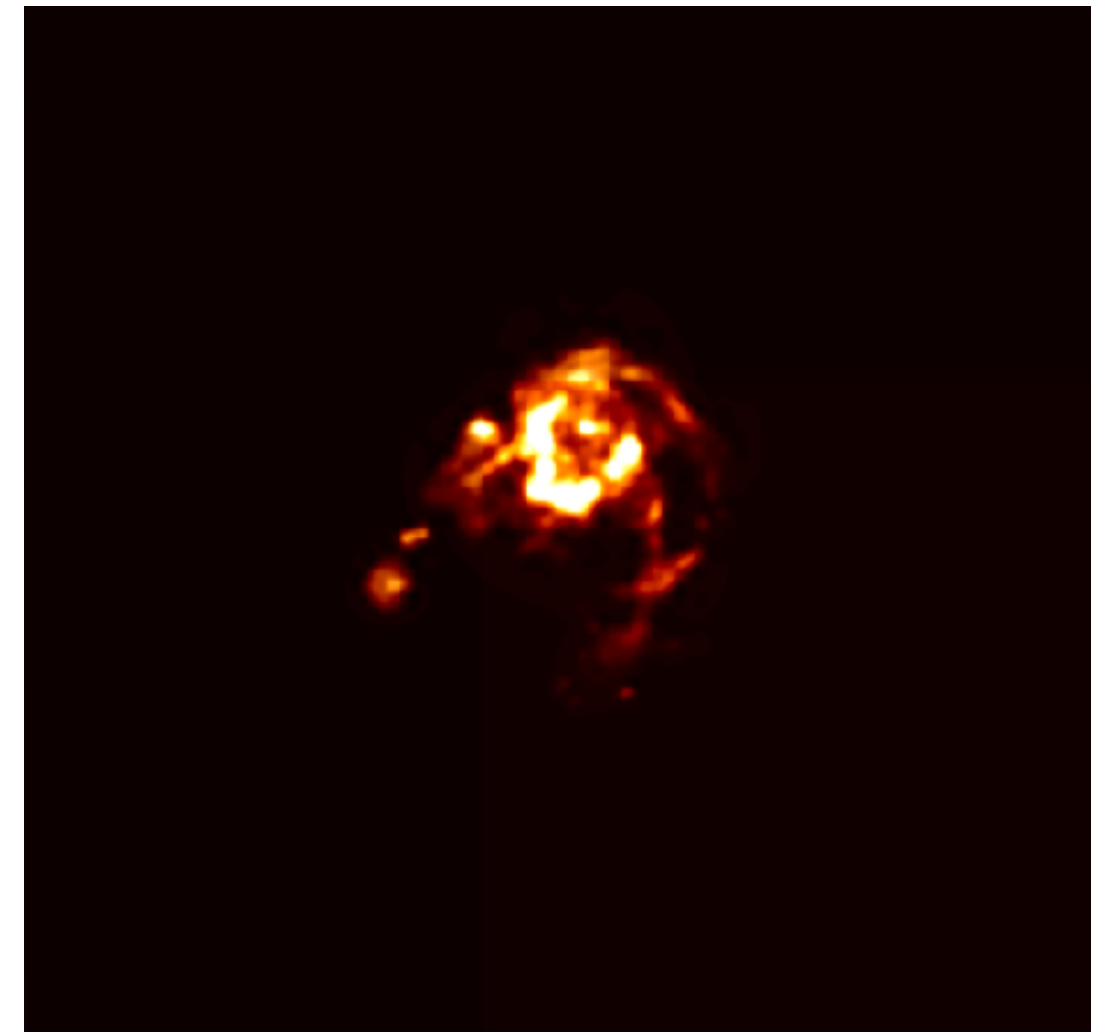
# Ideal Fourier transform

$$V(u, v) = \int I(x, y) e^{-2\pi i(ux+vy)} dx dy$$

Ideal visibilities



True image



Fourier  
Transform

This is true if we measure  $V(u,v)$  in EVERY point!

# Sampling of the (u,v) plane

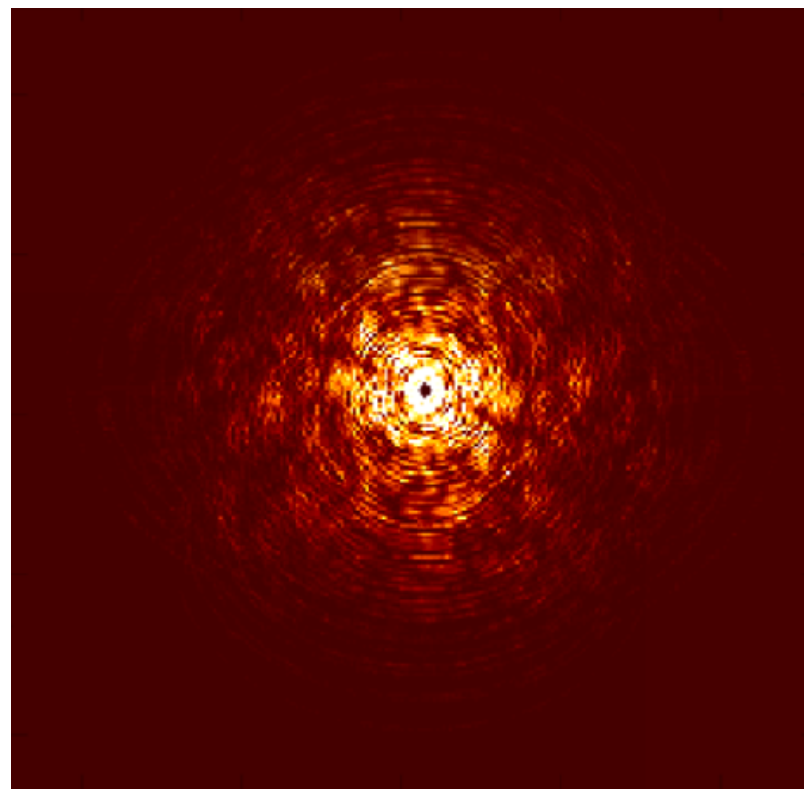
With a limited number of antennas, the uv-plane (u,v) is sampled in a discrete number of points

$$S(u, v) = \sum_k \delta(u_k, v_k)$$

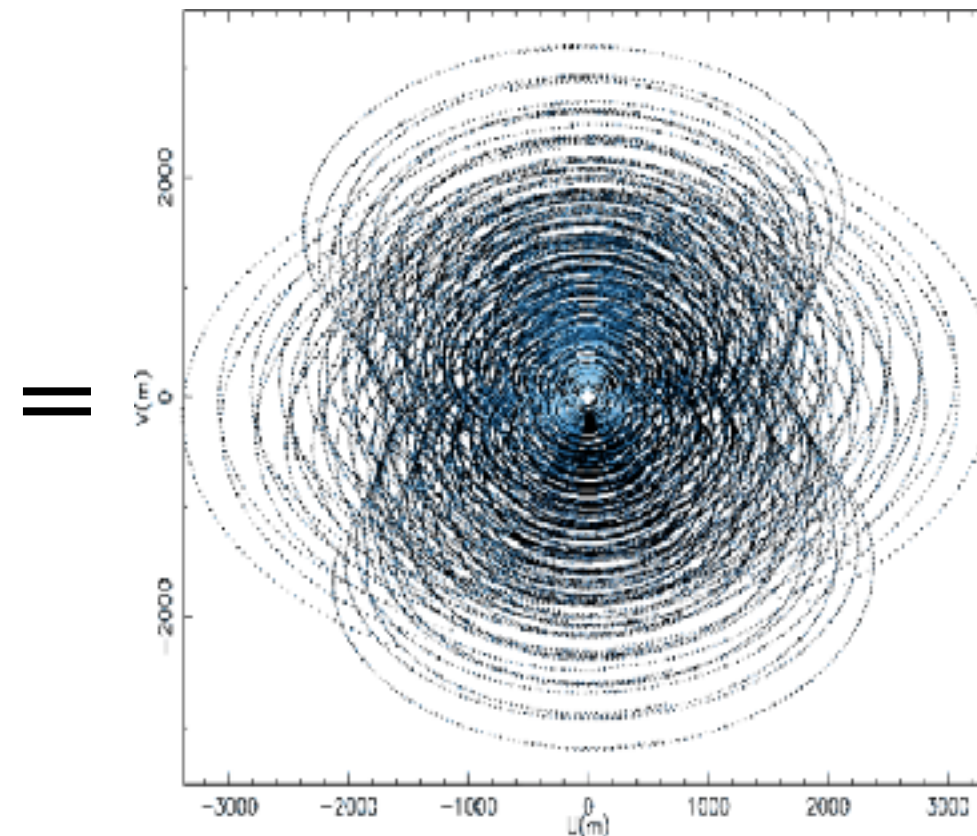
$$V_M(u, v) = S(u, v)V(u, v)$$

Measured

Ideal

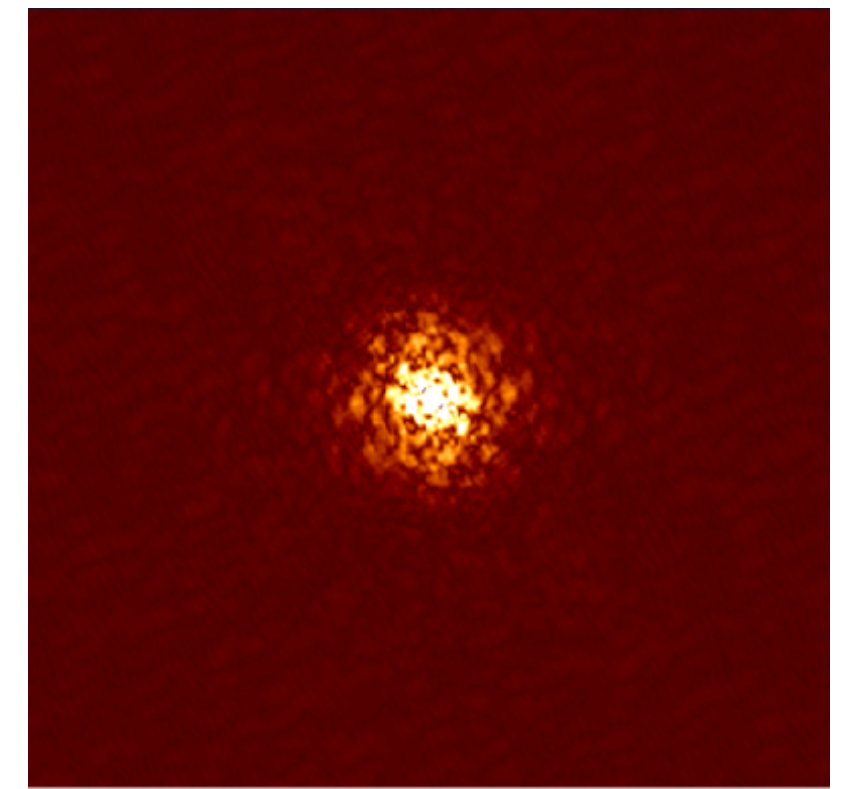


$V_M(u, v)$



$S(u, v)$

X



$V(u, v)$

# Sampling of the (u,v) plane

The uv-plane is sampled in discrete points:  
some information is lost

## Outer limit

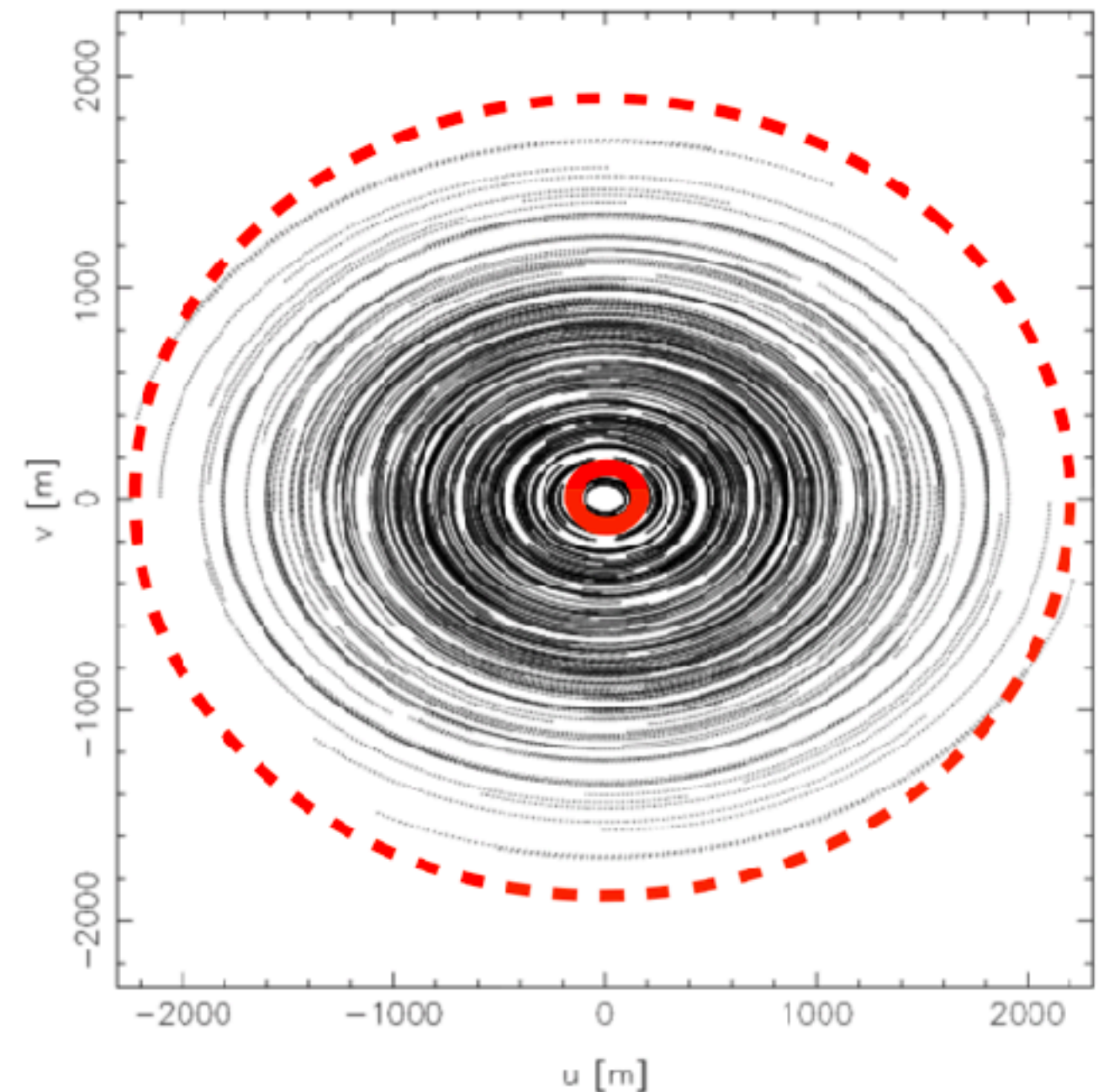
- We do not have measures beyond  $u_{\max}$ ,  $v_{\max}$
- It defines the angular resolution of the array

## Inner limit

- There is a "hole" in inner regions of  $S(u,v)$
- Information on large scales is missing
- Very extended structures are invisible ("spatial filtering")

## Sparse sampling

- We miss information in several regions of the (u,v) plane
- It contributes to the structure of the side lobes





# Sampling of the (u,v) plane

The Fourier transform of the measured visibilities gives the dirty image:

$$I_D(x, y) = FT^{-1}[V_M(u, v)] = FT^{-1}[S(u, v)V(u, v)]$$

Using the convolution theorem we obtain:

$$I_D(x, y) = B_D(x, y) * I(x, y) \quad B_D(x, y) = FT^{-1}[S(u, v)]$$

The dirty image is the convolution of the dirty beam with the true image

**To obtain  $I(x,y)$  we need to deconvolve  $B_D(x,y)$  from  $I_D(x,y)$**

# “Weighting schemes”

The dirty image (and dirty beam) can be weighted:

$$I_D(x, y) = \frac{\sum_k FT^{-1}[W_k(u, v)S(u, v)V(u, v)]}{\sum_k W_k}$$

$$W_k = \frac{1}{\sigma_k^2}$$

## Natural

- Maximises point source sensitivity, high side-lobes

$$W_k = \frac{1}{\sigma_k^2 \rho(u_k, v_k)}$$

## Uniform

- High angular resolution, lower sensitivity to point sources.

$$W_k = \frac{1 + s}{\sigma_k^2 \left[ 1 + \frac{s \rho(u_k, v_k)}{\sigma_k^2} \right]}$$

## Robust

- It's an intermediate choice between natural and uniform, the parameter  $s$  ranges  $[-2, 2]$

$$W_k = \frac{1}{\sigma_k^2} e^{-\frac{(u^2 + v^2)}{t^2}}$$

## Tapering

- Adds a down-weighting to the high-spatial frequencies

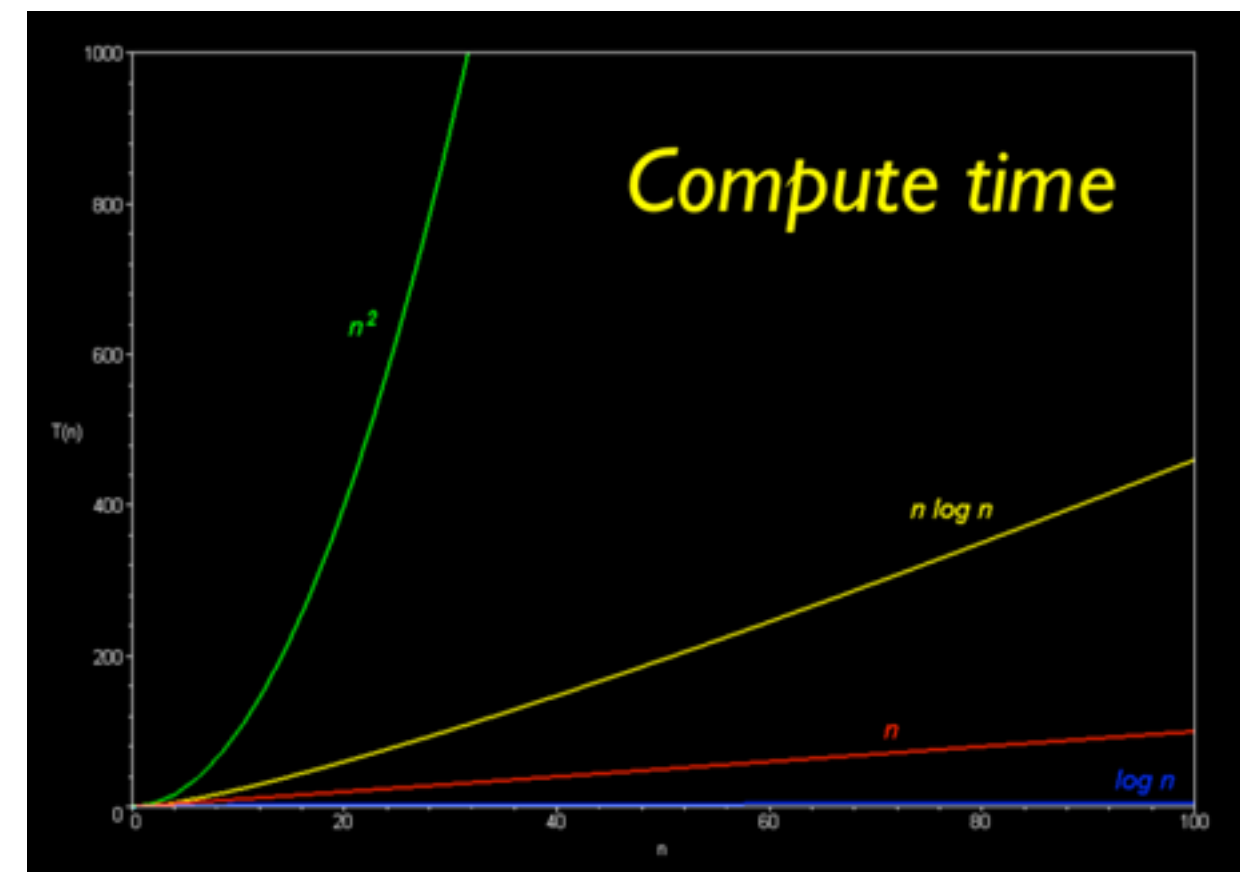
# Computing the dirty image

## Fourier Transform

- Use algorithm Fast Fourier Transform (FFT)
- Computing time scales with  $N \log N$  for a  $N \times N$  image
- FFT needs a regular grid

## Gridding

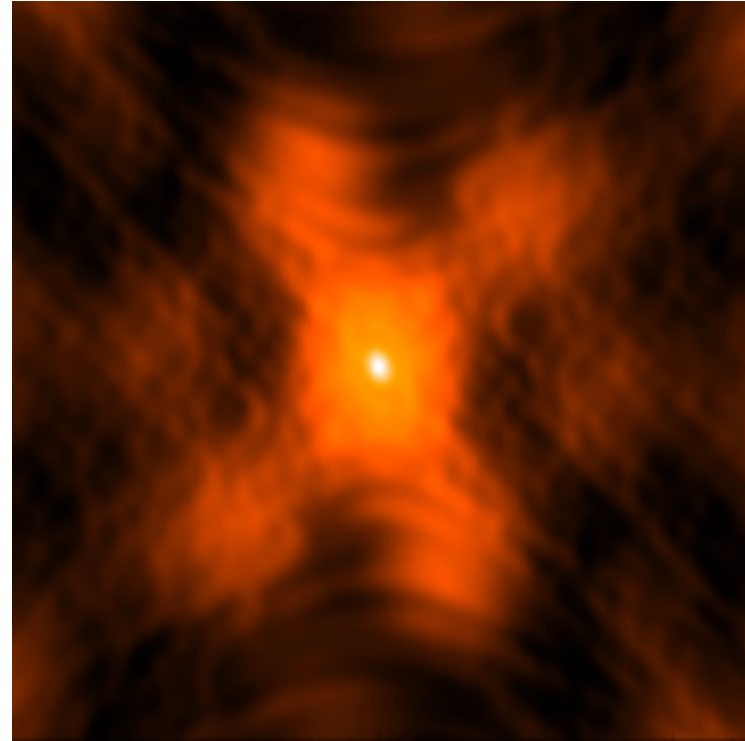
- The data  $V_M(u,v)$  are obtained on an irregular grid
- They are mapped onto a regular grid (sides are a multiple of 2)
- Grid points where no uv-data are present are set to 0.



# "Weighting schemes"

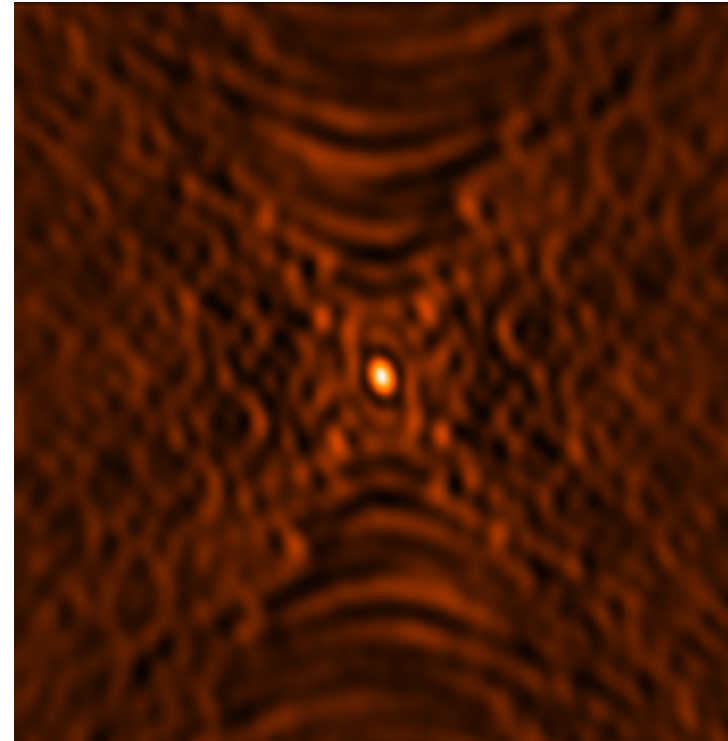
**Natural**

Beam  $\sim 0.77 \times 0.62$



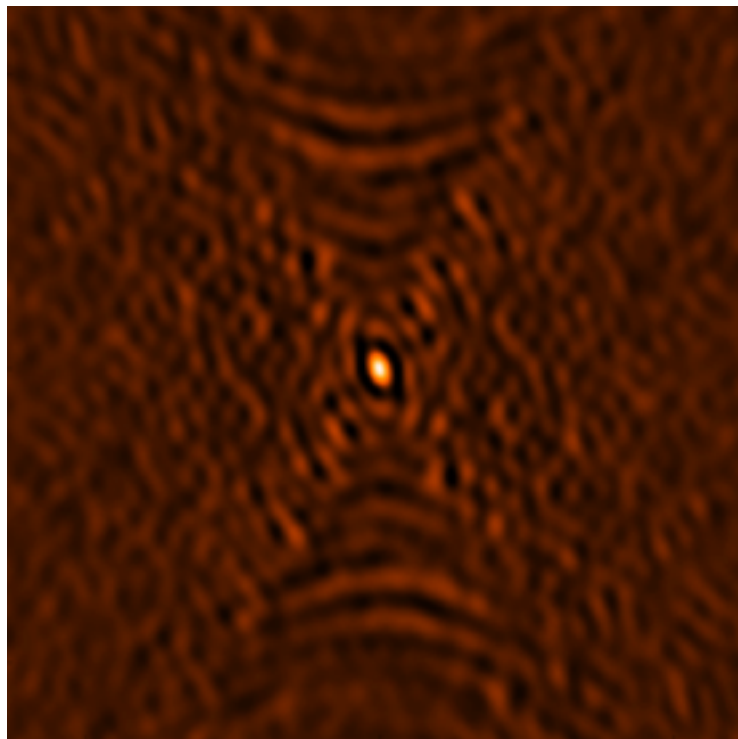
**Robust -1**

Beam  $\sim 0.41 \times 0.36$



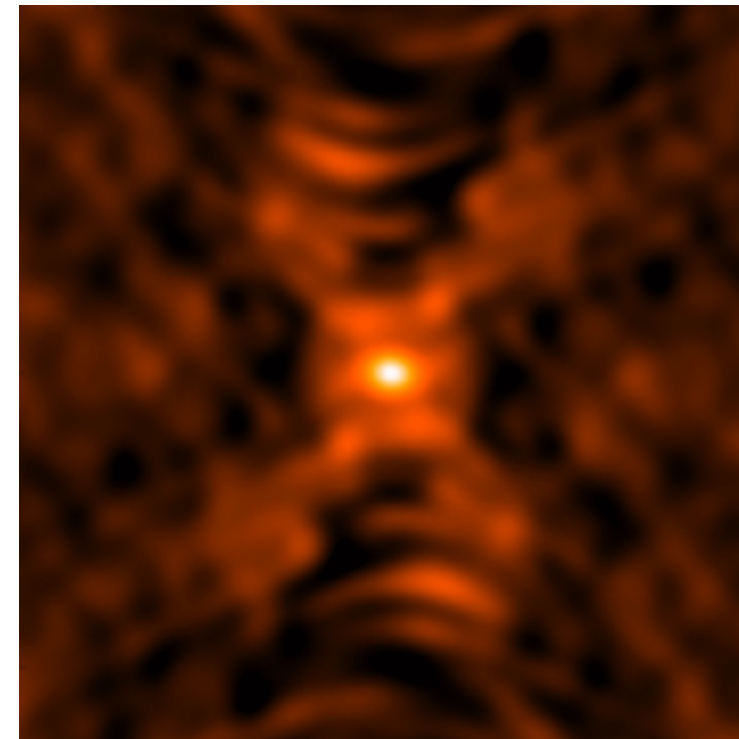
**Uniform**

Beam  $\sim 0.39 \times 0.31$

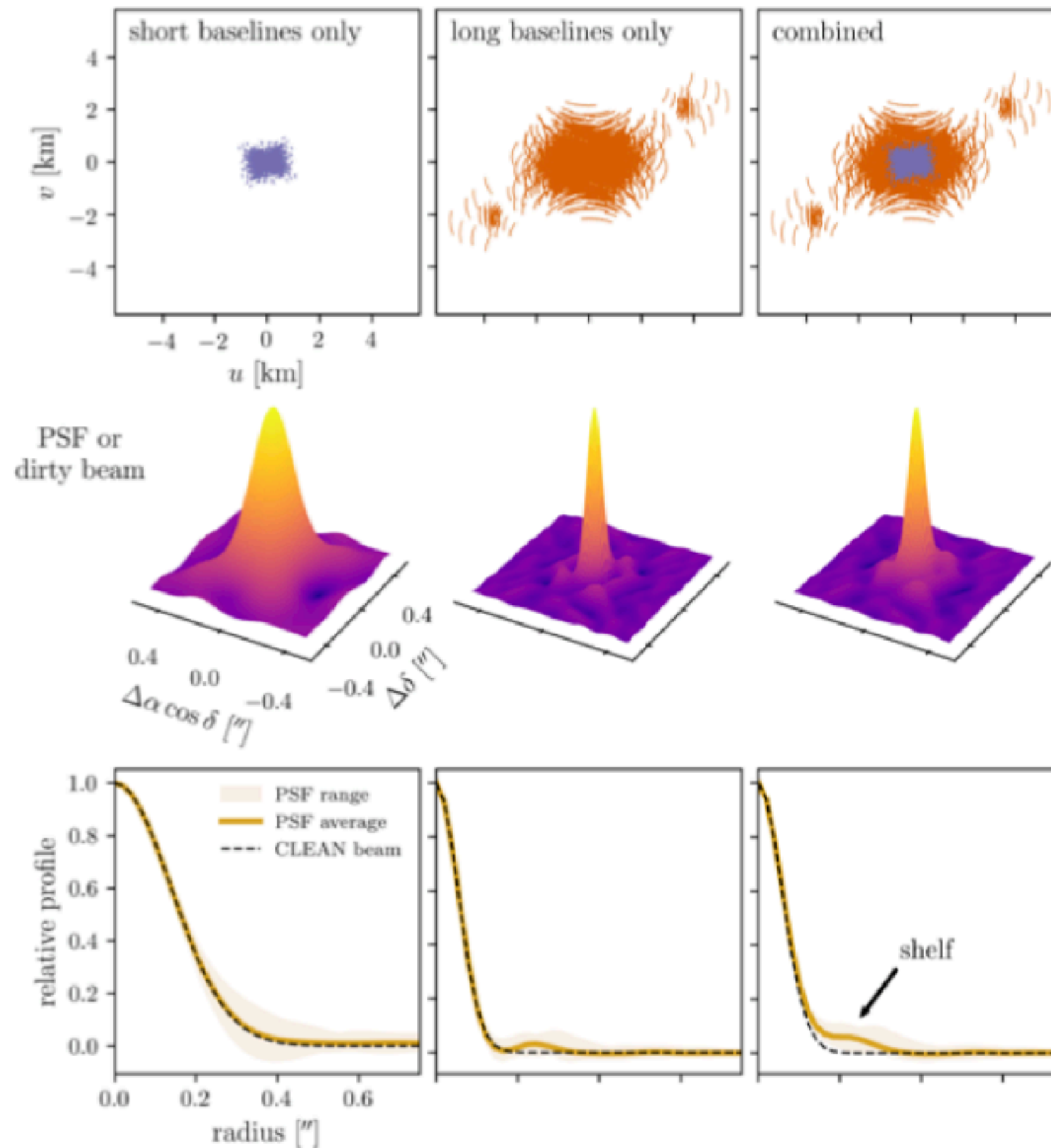


**uv-taper**

Beam  $\sim 0.77 \times 0.62$

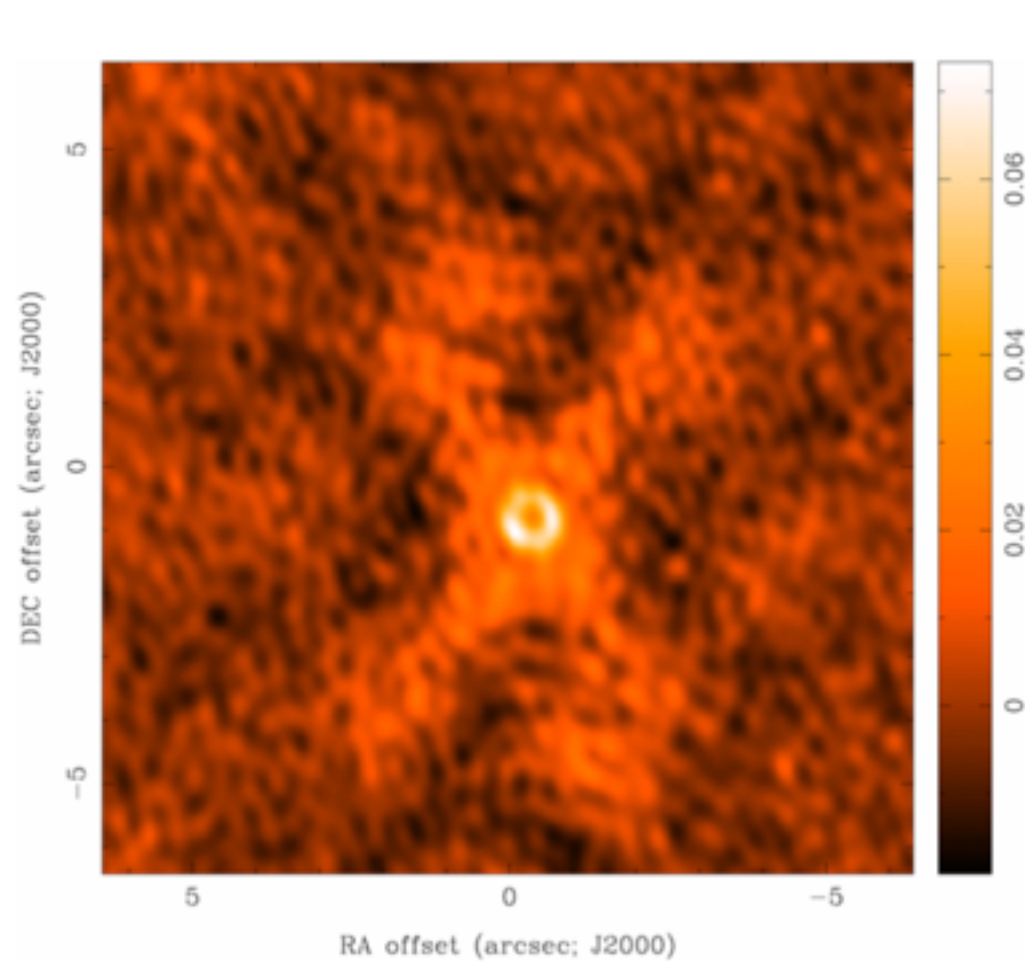


# Dirty beam combining different configurations

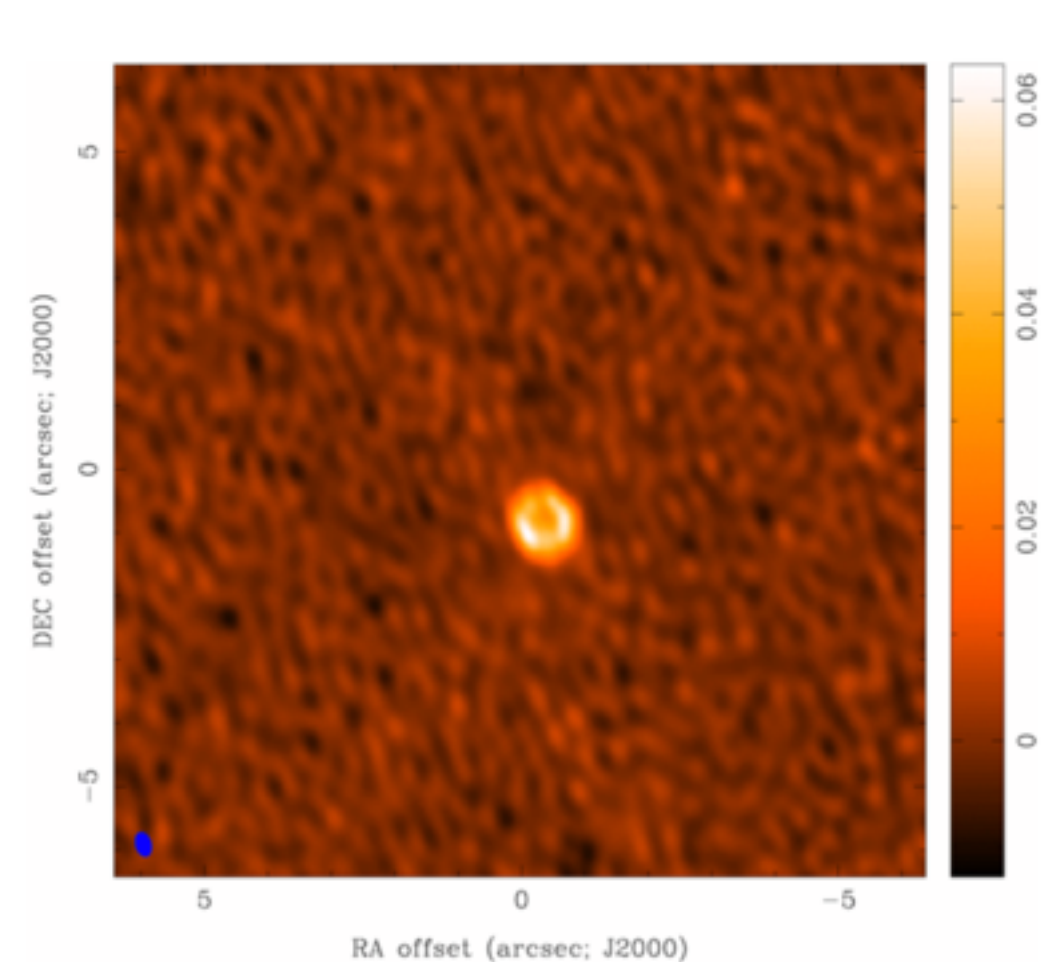


# Deconvolution

- After calibration and FT:  $V_M(u,v) \rightarrow I_D(x,y)$
- We need to deconvolve  $B_D(x,y)$  from  $I_D(x,y)$  to obtain  $I(x,y)$
- Information is incomplete, there is noise in the data: pay attention with this step!



Dirty image



Scientific image

# Methods of image reconstruction

- **CLEAN**  
The sky model is the sum of point-sources
- **Multi-scale CLEAN** (very relevant for disks)  
The sky model is the linear combination of Gaussians with FWHM defined by the user (typically 5)
- **Adaptive-Scale-Pixel CLEAN** (may be used more in near future)  
The sky model is the linear combination of Gaussians with FWHMs that are computed on the fly.
- **Regularized Maximum Likelihood (RML) algorithms**  
This is not a deconvolution process, but it's a non-parametric forward model of the sky intensity, with additional constraints (e.g., smoothness, positivity).

# CLEAN

Developed by Hogbom in 1974. It assumes that the sky is a the linear combination of point sources:

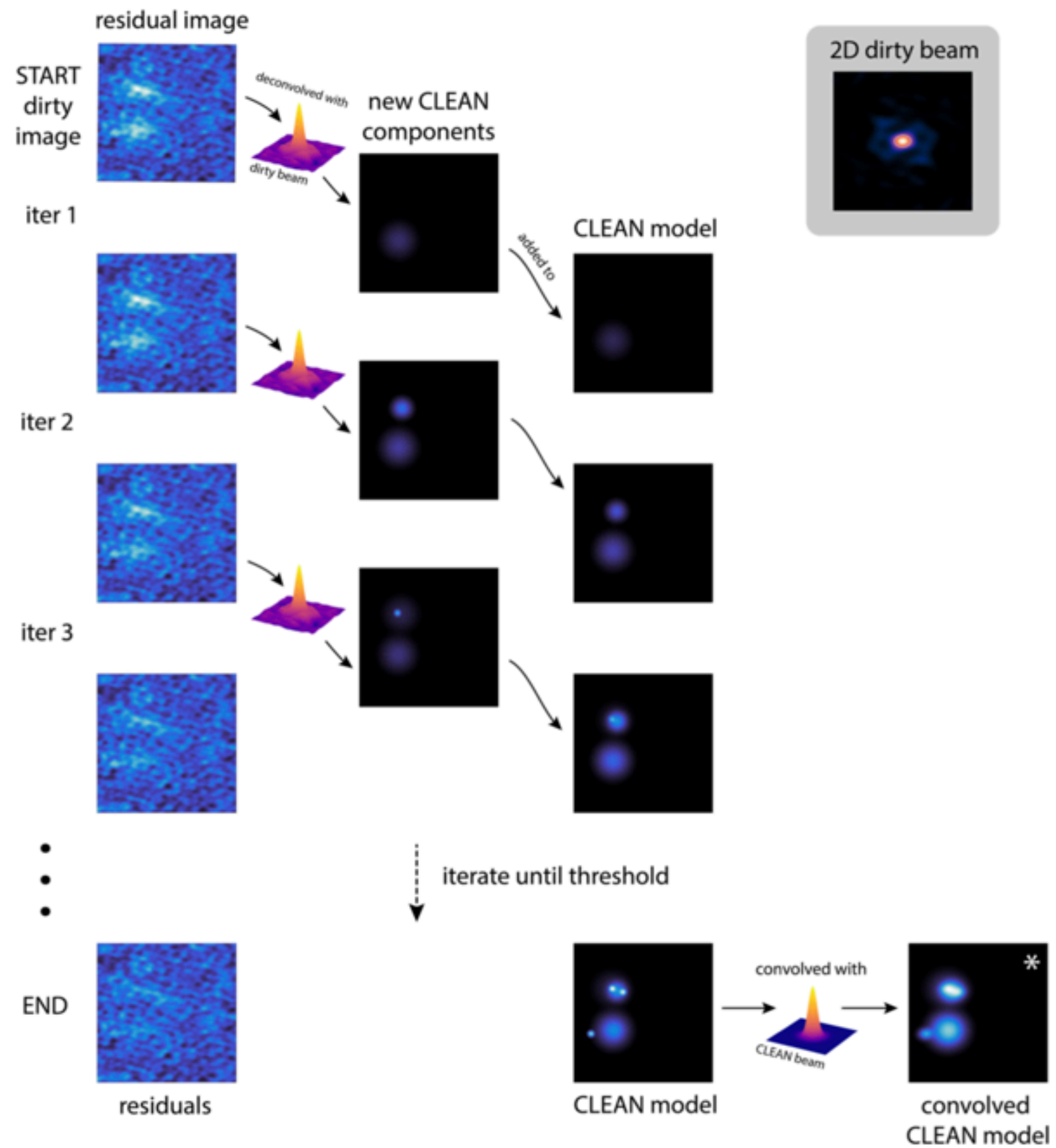
$$I(x, y) = \sum_i a_i \delta(x_i, y_i)$$

*Iterative process:*

1. The dirty beam and dirty image are computed with FFT.
2. We find the intensity peaks
3. We assign a delta function to the position of the peak with the measured amplitude to a sky model
4. We subtract a fraction of the model from the residual map using a parameter gain  $\gamma$
5. We go back to step 2 and keep going, until we reach a threshold we had defined for the maximum residual
6. We convolve the sky model with a Gaussian fit of the primary beam and we add the residual map to obtain the final image

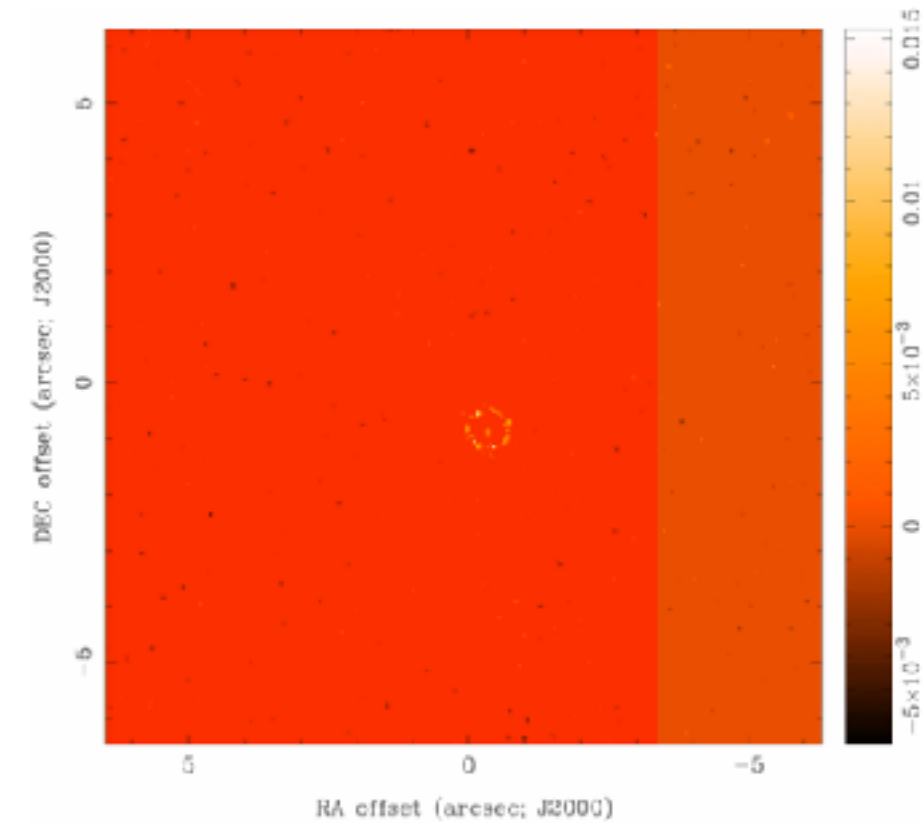
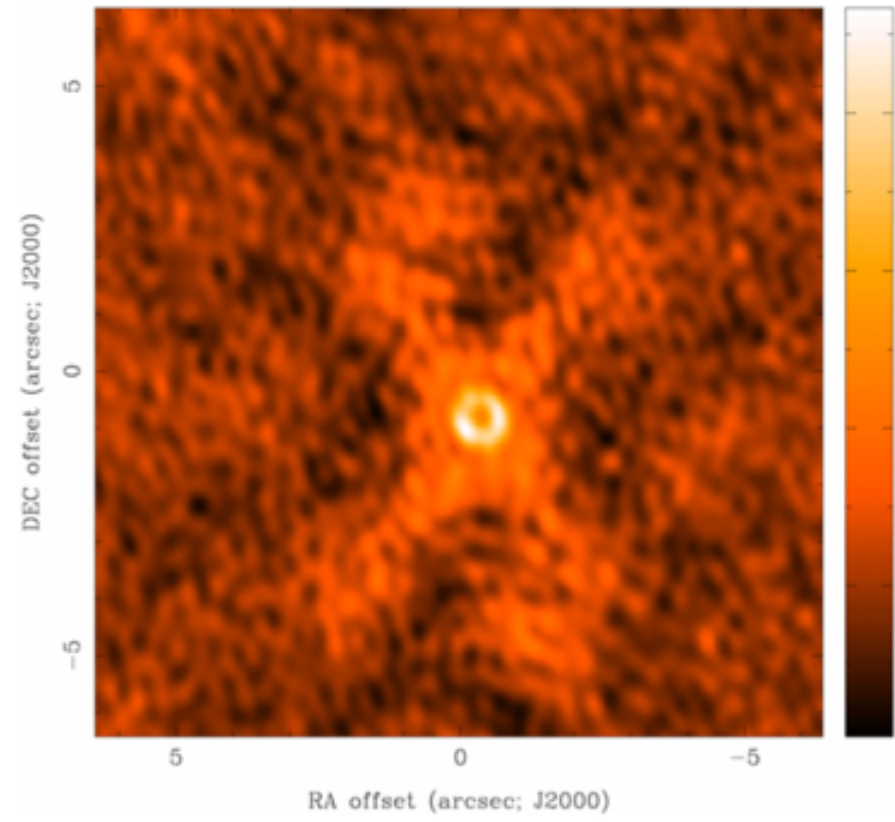


# CLEAN



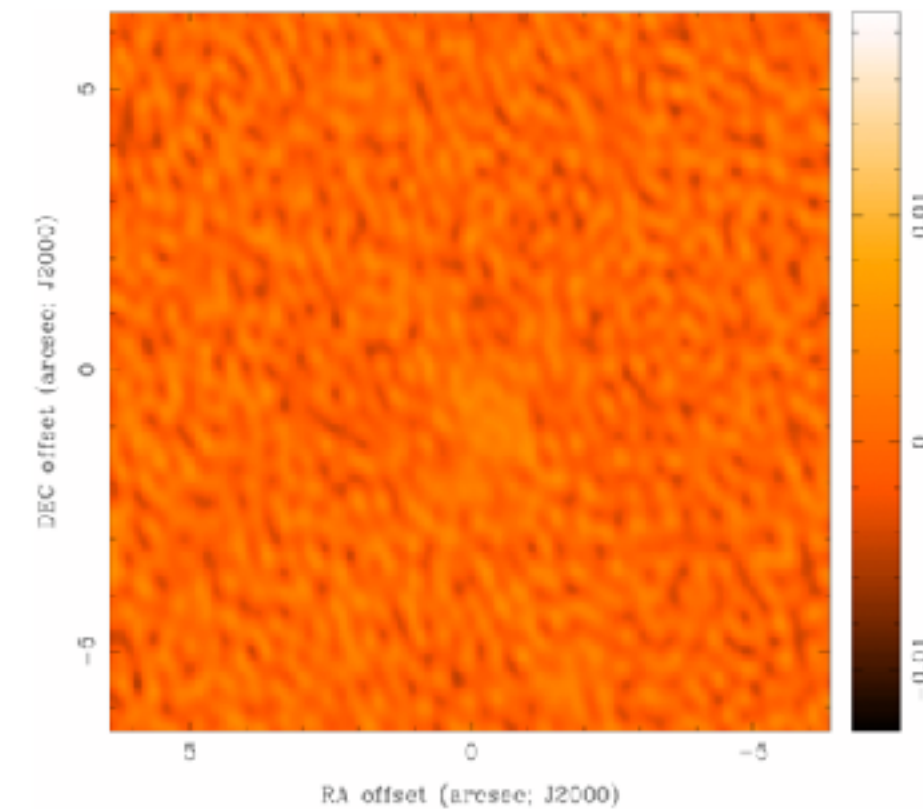
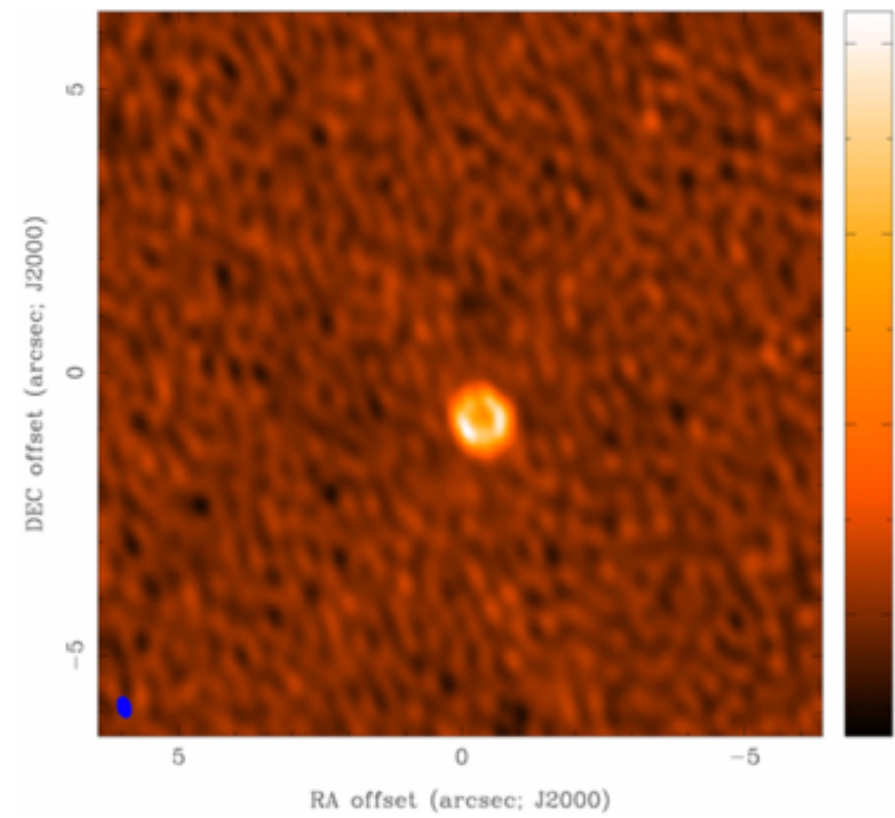
# CLEAN

Dirty image



CLEAN model

Final image

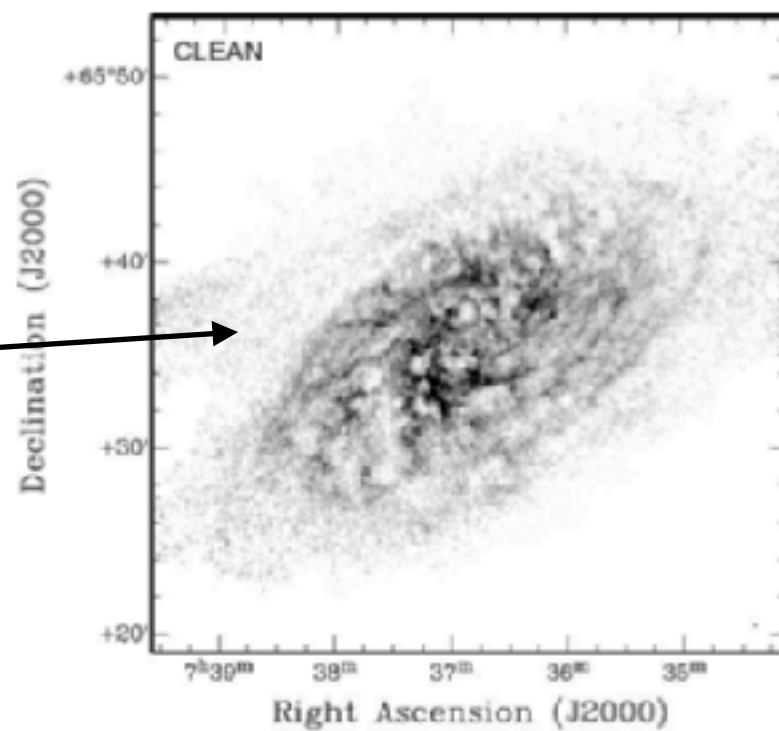


Residual map

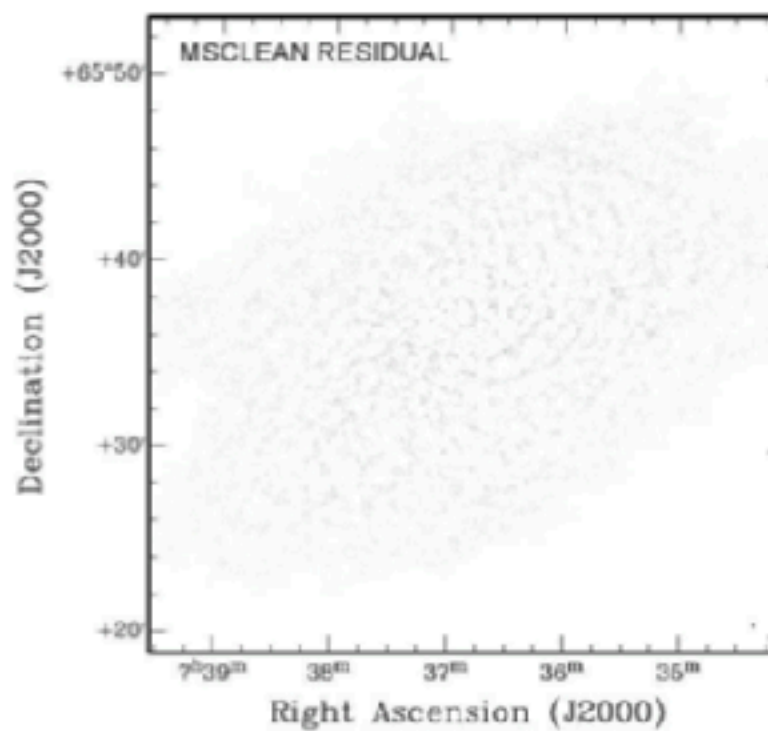
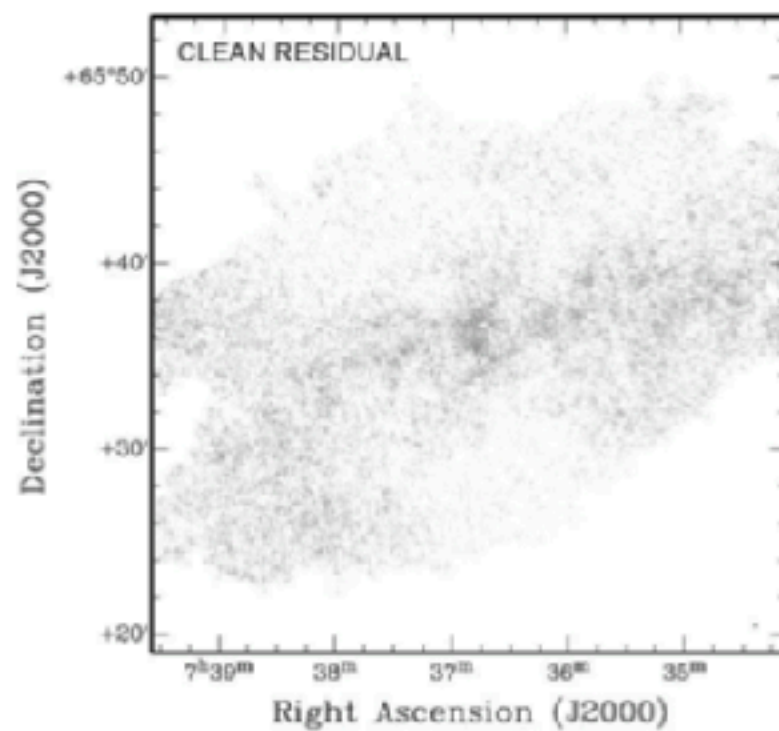
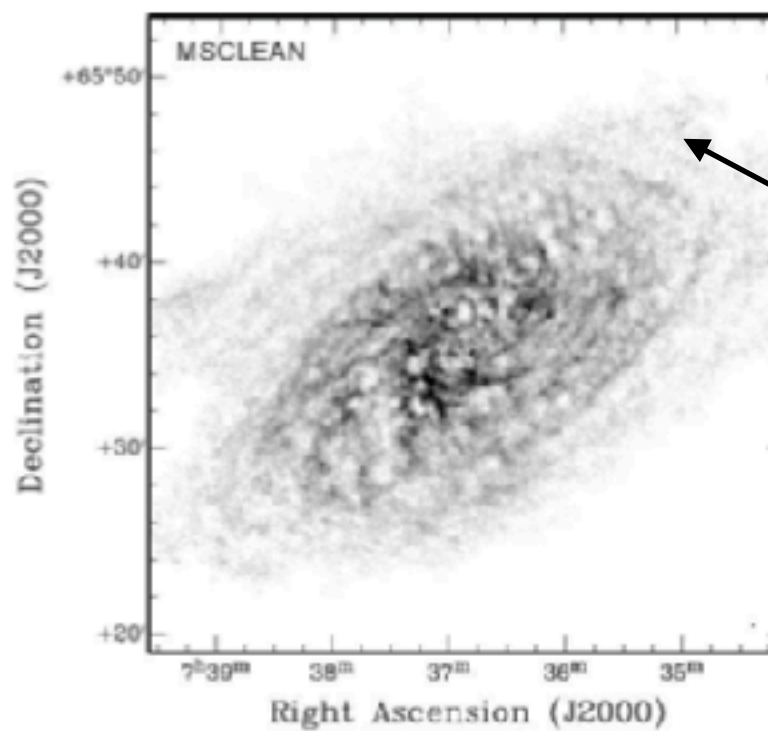
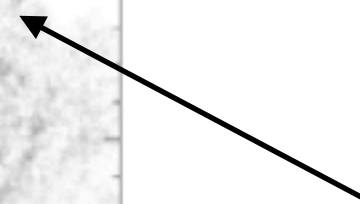
# Multi-scale CLEAN

It is very relevant for extended sources  
(classic CLEAN is optimized for point sources)

**Blotchy**

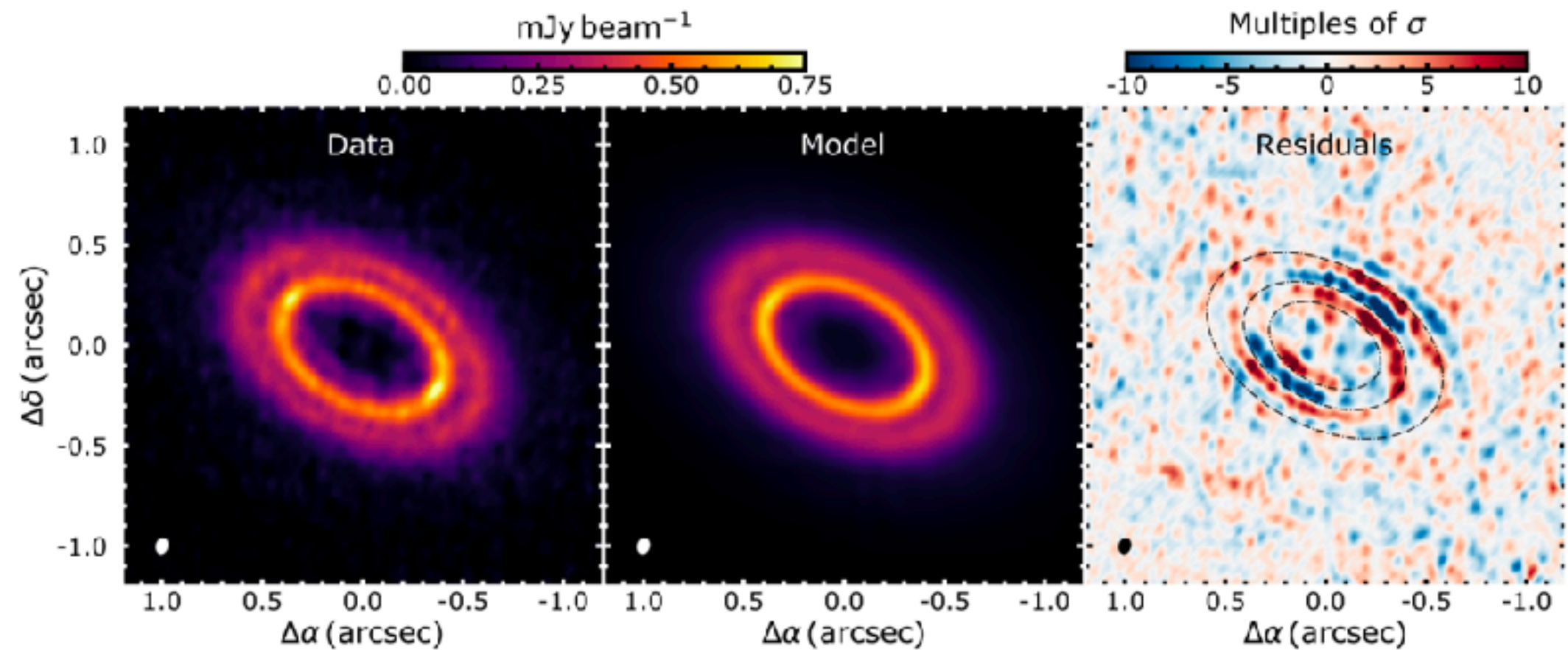
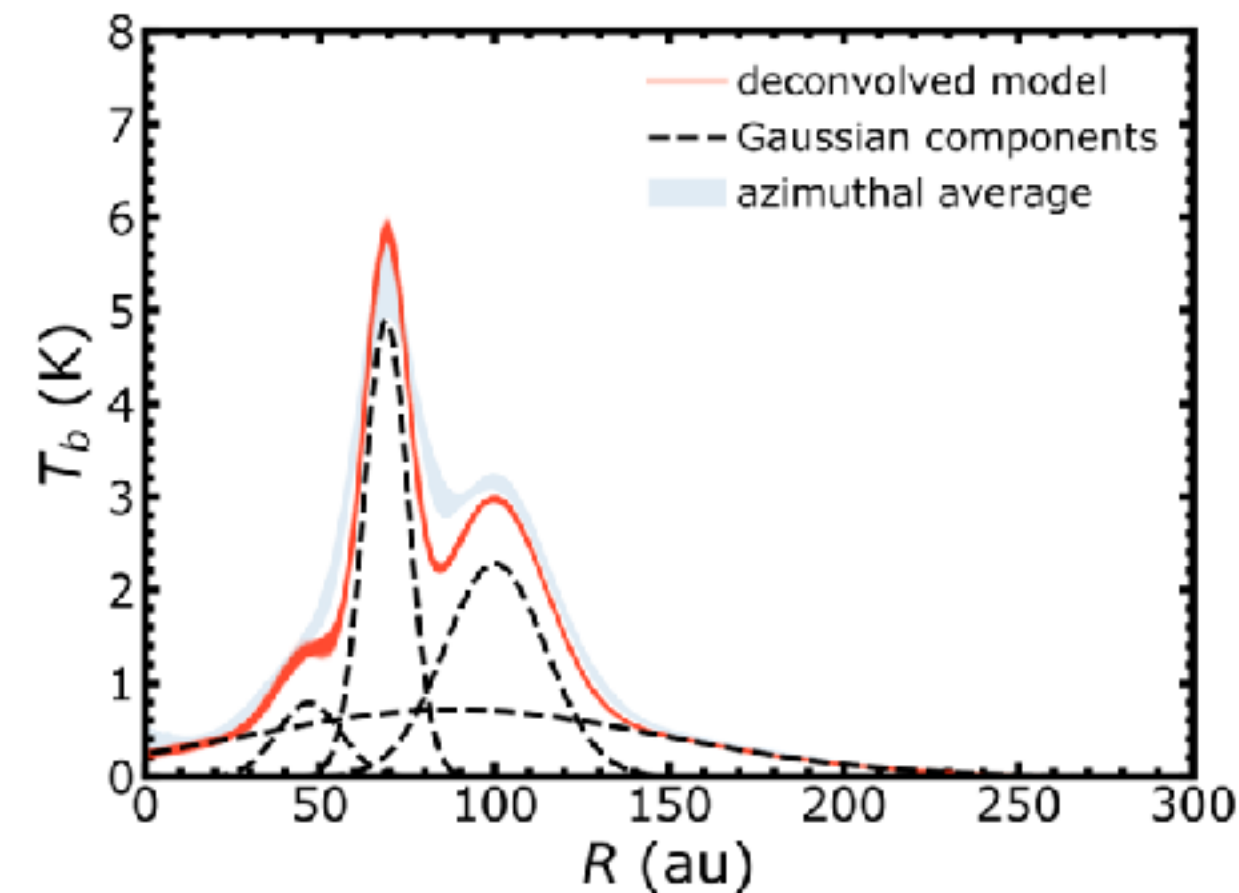


**Smooth**



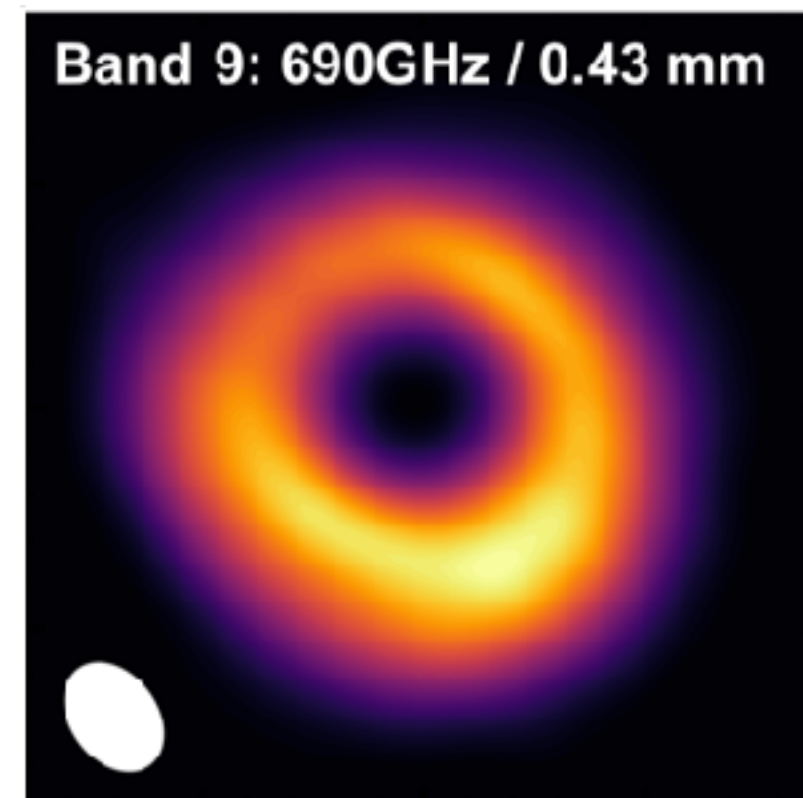
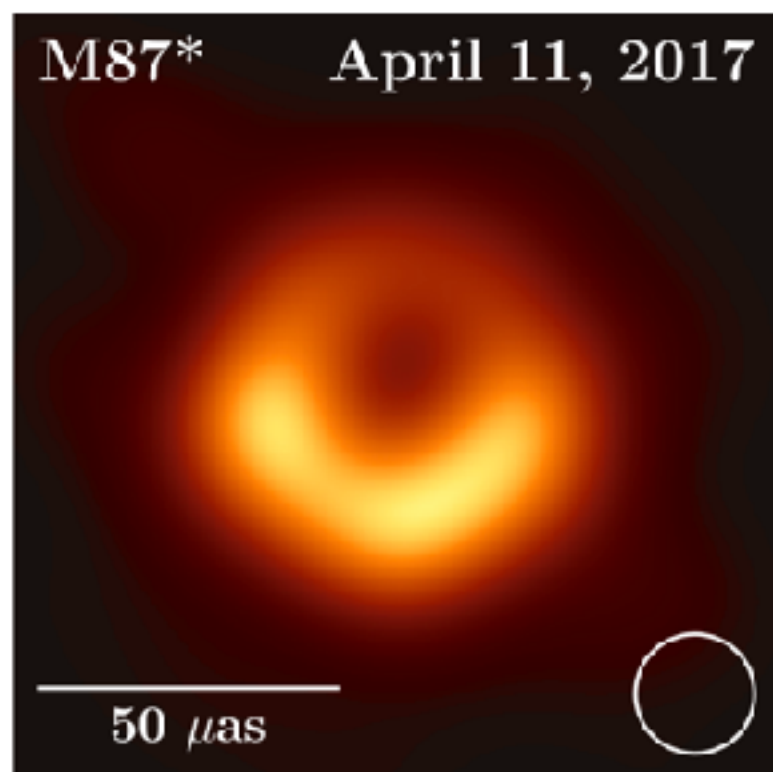
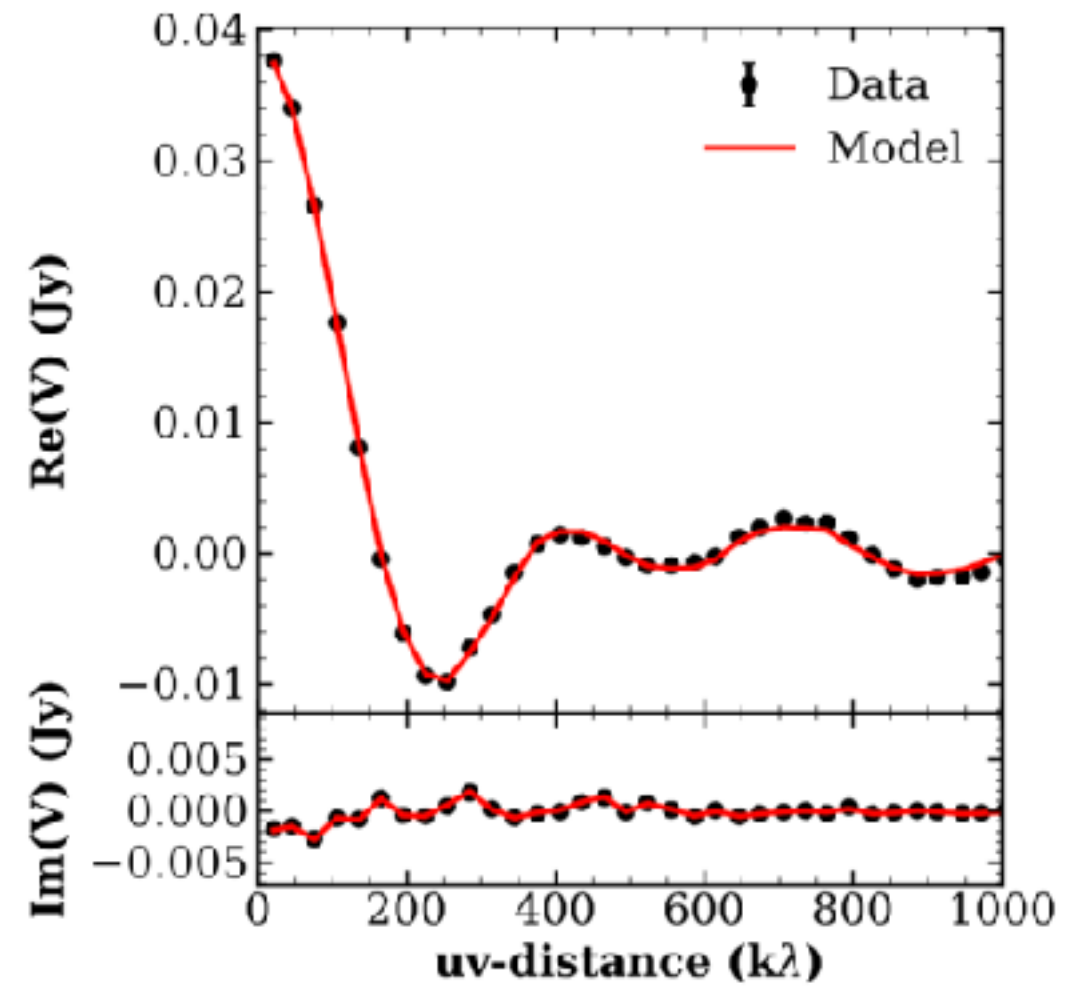
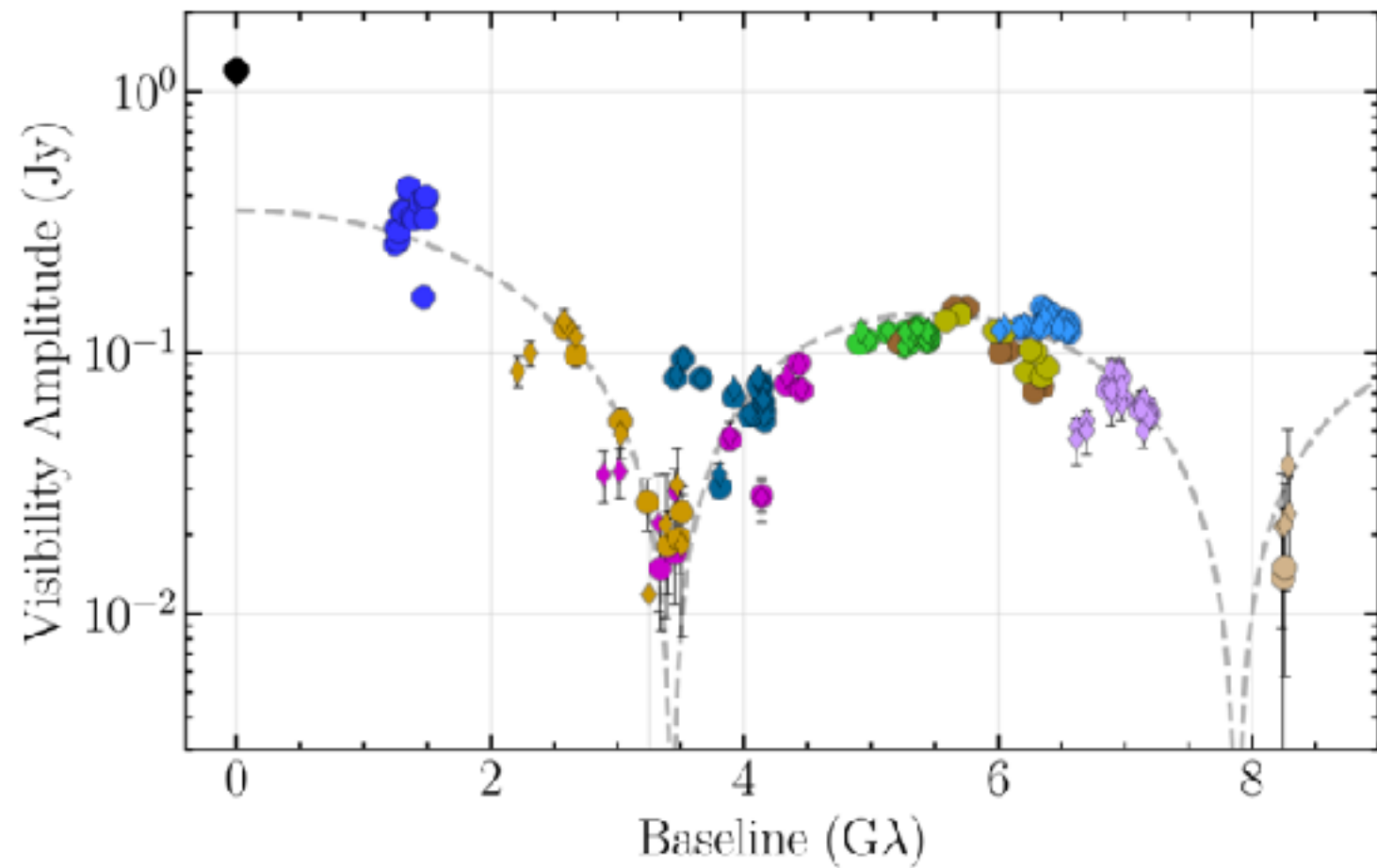
# Data analysis in the uv-plane

In order to avoid the convoluted error propagation in the image reconstruction, in several cases the data are fitted directly in the uv-plane

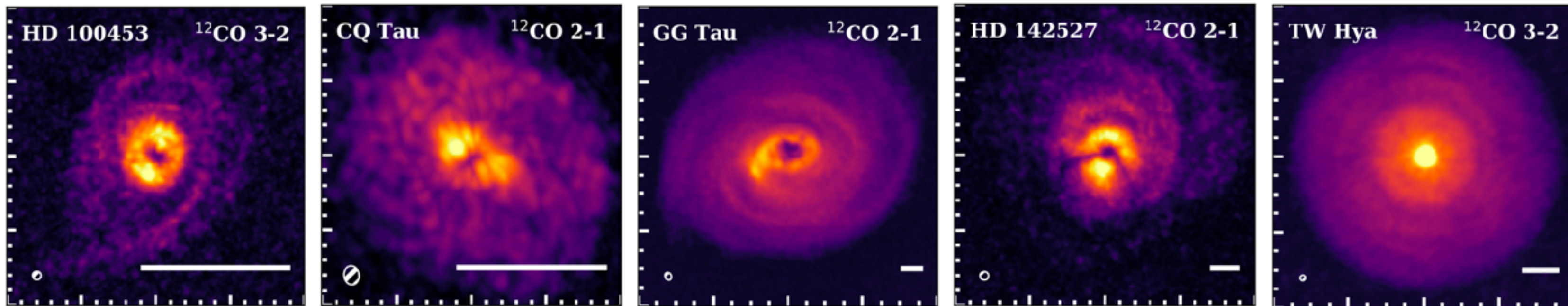


- Better treatment of the uncertainties
- It is possible to make better use of the very long baselines to reach a "super"-resolution

# Data analysis in the uv-plane



# Disk kinematics

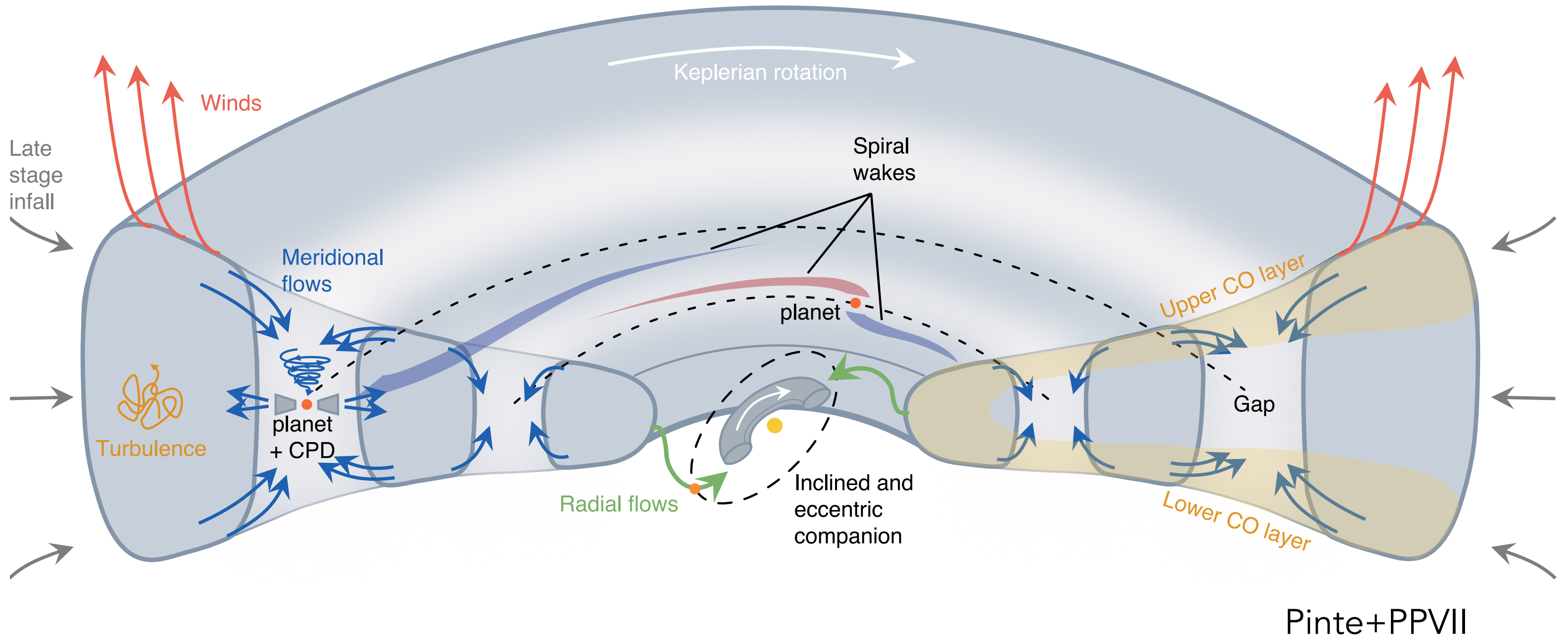


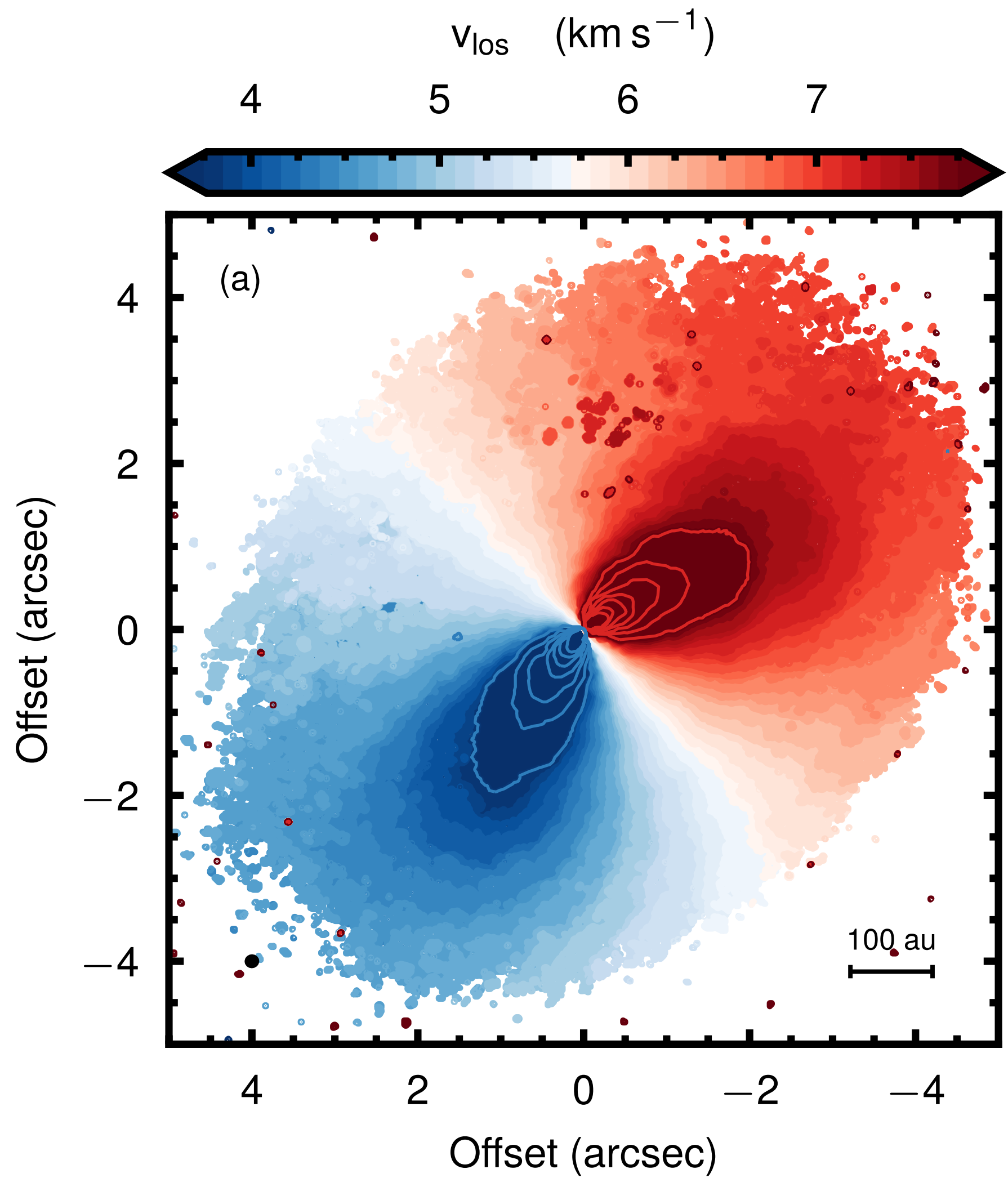
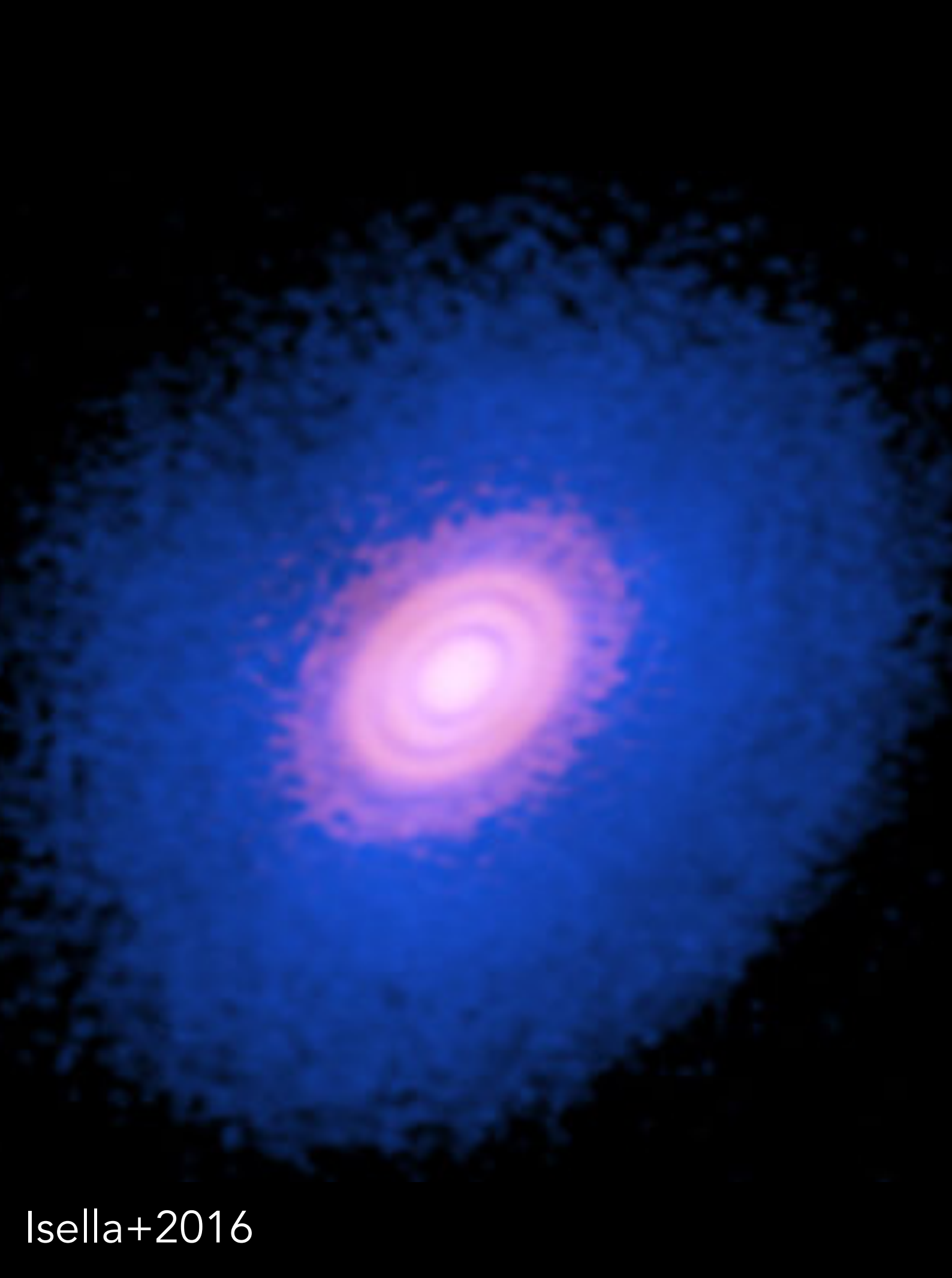
Wölfer+subm

It probes the disk *gas* dynamics, a fundamental driver regulating disk evolution and dust dynamics on small scales (e.g., turbulence) and the whole disk extent (e.g., winds).

The dynamics can be used to trace ongoing physical processes, such as (M)HD-instabilities, planet-disk interactions, stellar fly-bys, etc.

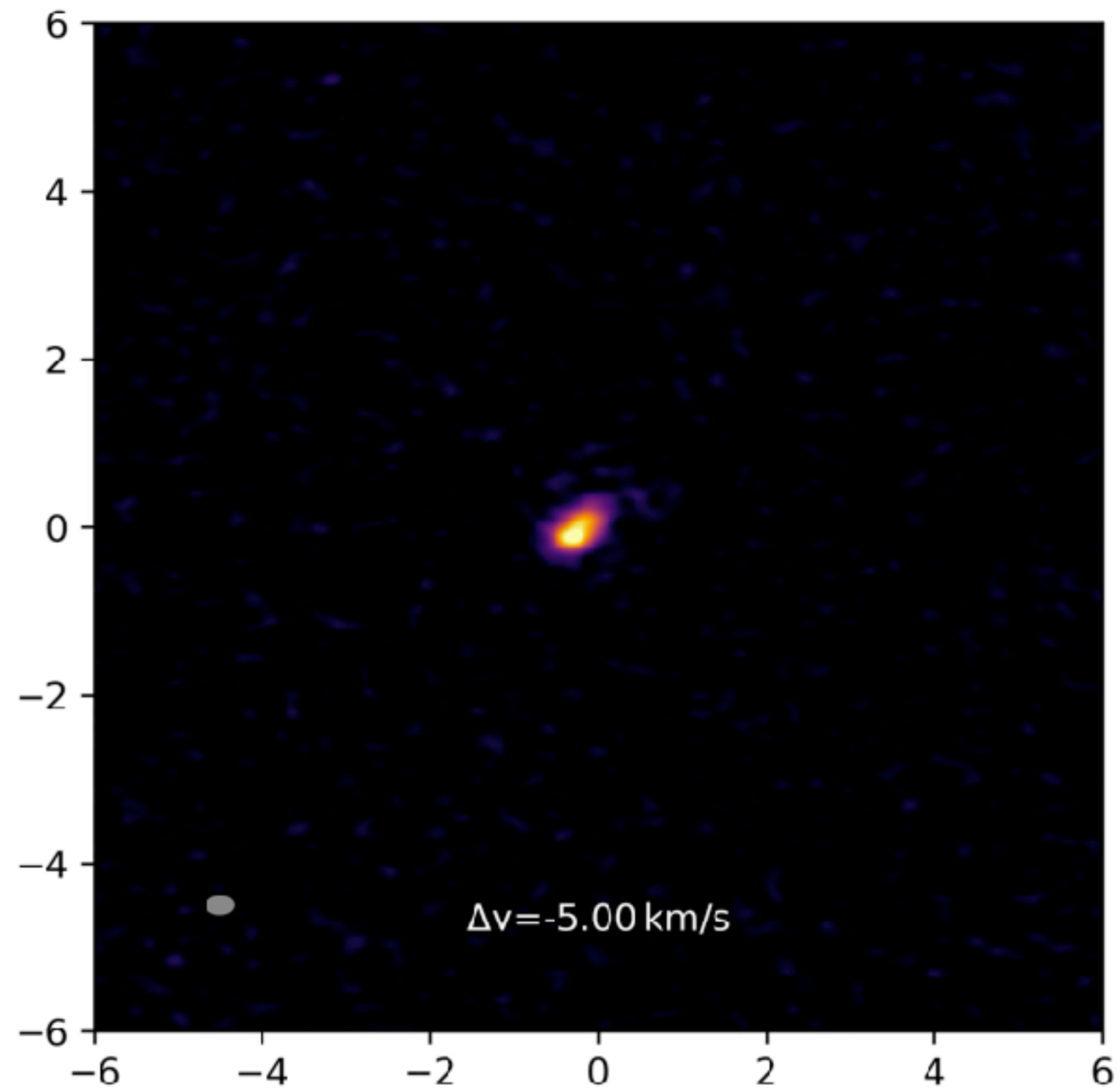
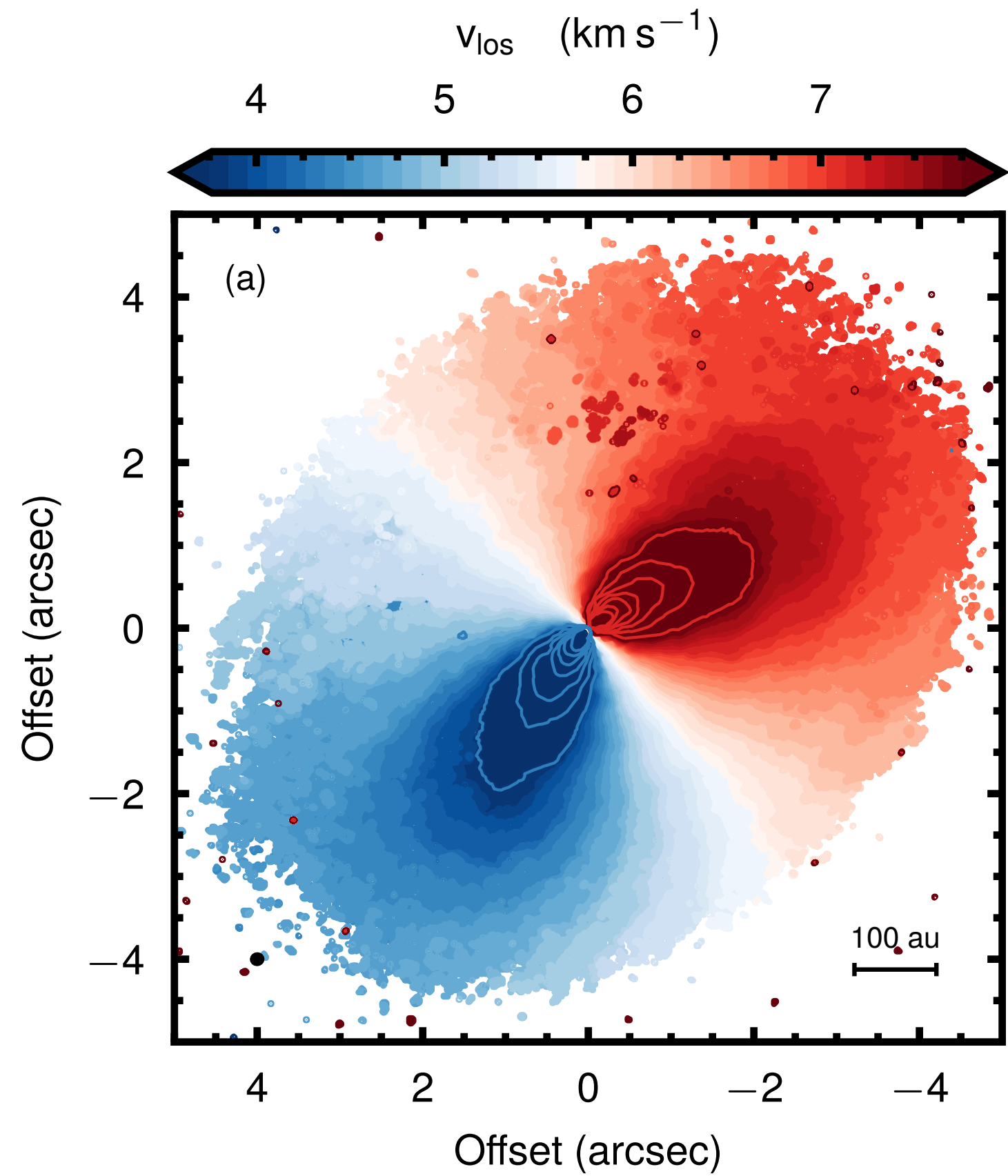
# Disk kinematics



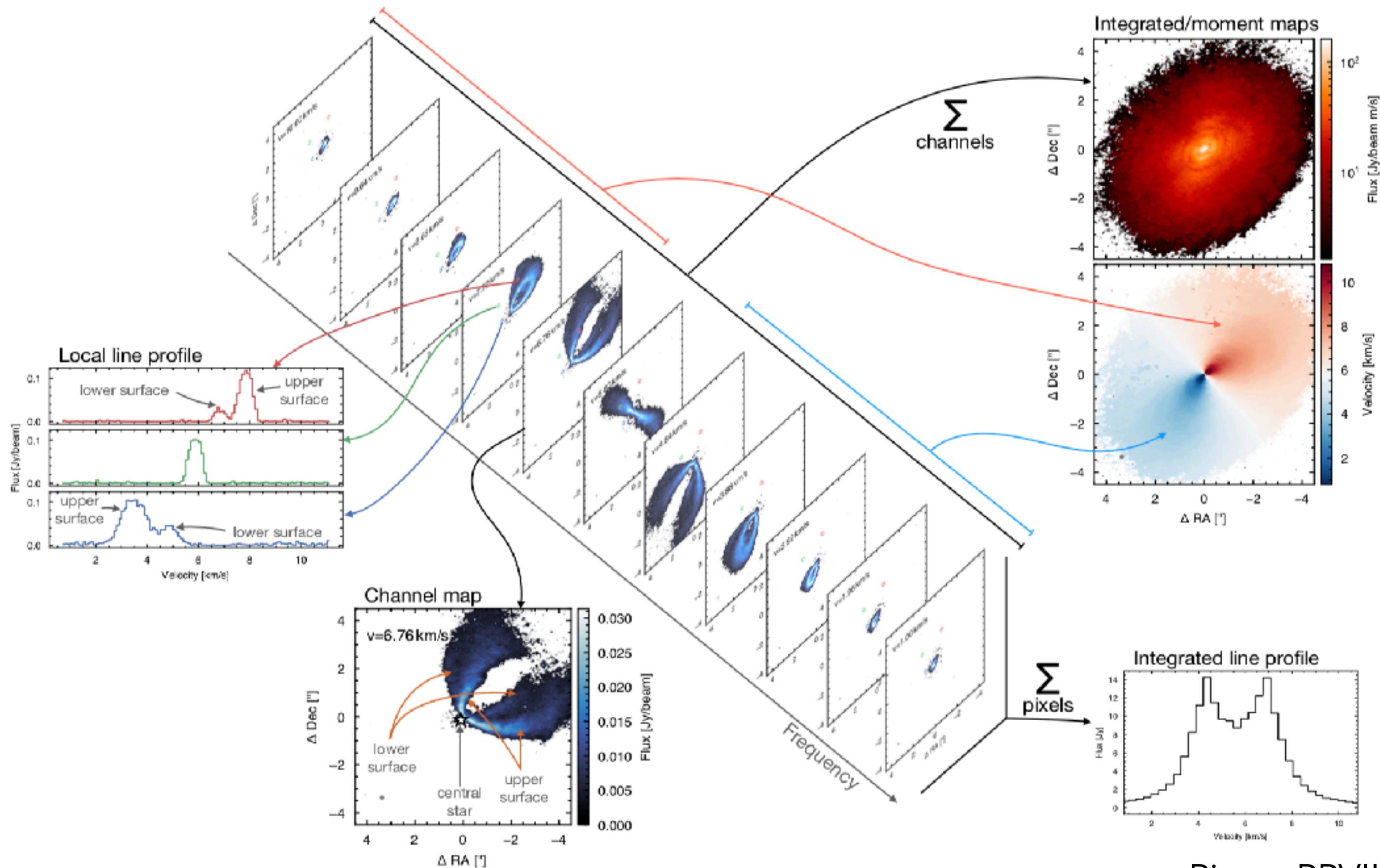




# Disk kinematics



# A data cube



# Typical velocities in disks

- Keplerian:

$$v_{\phi, \text{K}}(r) = \sqrt{\frac{GM_*}{r}} \approx 3.0 \sqrt{\frac{M_*}{M_{\odot}}} \sqrt{\frac{100 \text{au}}{r}} \text{km s}^{-1}$$

- Sound speed:

$$c_s = \sqrt{\frac{k_B T_{\text{gas}}}{\mu m_h}} \approx 300 \sqrt{\frac{T_{\text{gas}}}{25 \text{K}}} \text{m s}^{-1}$$

- Line width (thermal+turbulent):

$$\Delta v = \sqrt{\frac{2k_B T_{\text{gas}}}{m_{\text{mol}}} + \delta v_{\text{turb}}^2} \approx \sqrt{(120 \text{m s}^{-1})^2 + \delta v_{\text{turb}}^2}$$

- Accretion:

$$|v_{\text{r,acc}}| \sim \alpha \left(\frac{h}{r}\right)^2 v_{\text{Kep}} \lesssim 10^{-4} v_{\text{Kep}}$$

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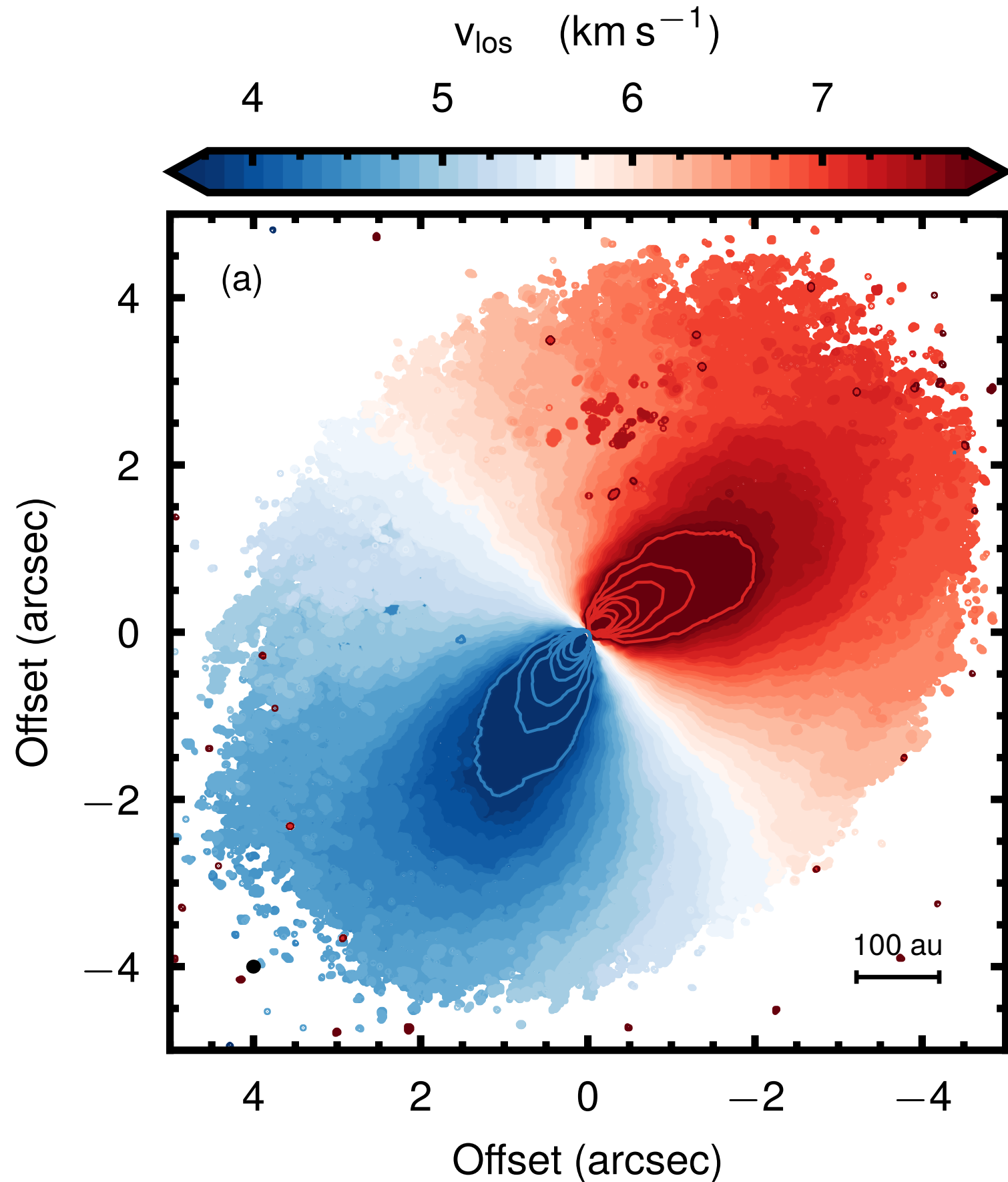
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**ALMA can reach an rms of 5K over one 50 m/s channel at 0.1" in ~10h**

# Molecular emission height



Retrieving the disk surface is key to interpret astrochemical models, and to correctly de-project the velocity structures

The isovelocity curves show a clear bending due to the thick disk structure: it is possible to retrieve disk surface, but not the best way

# Molecular emission height

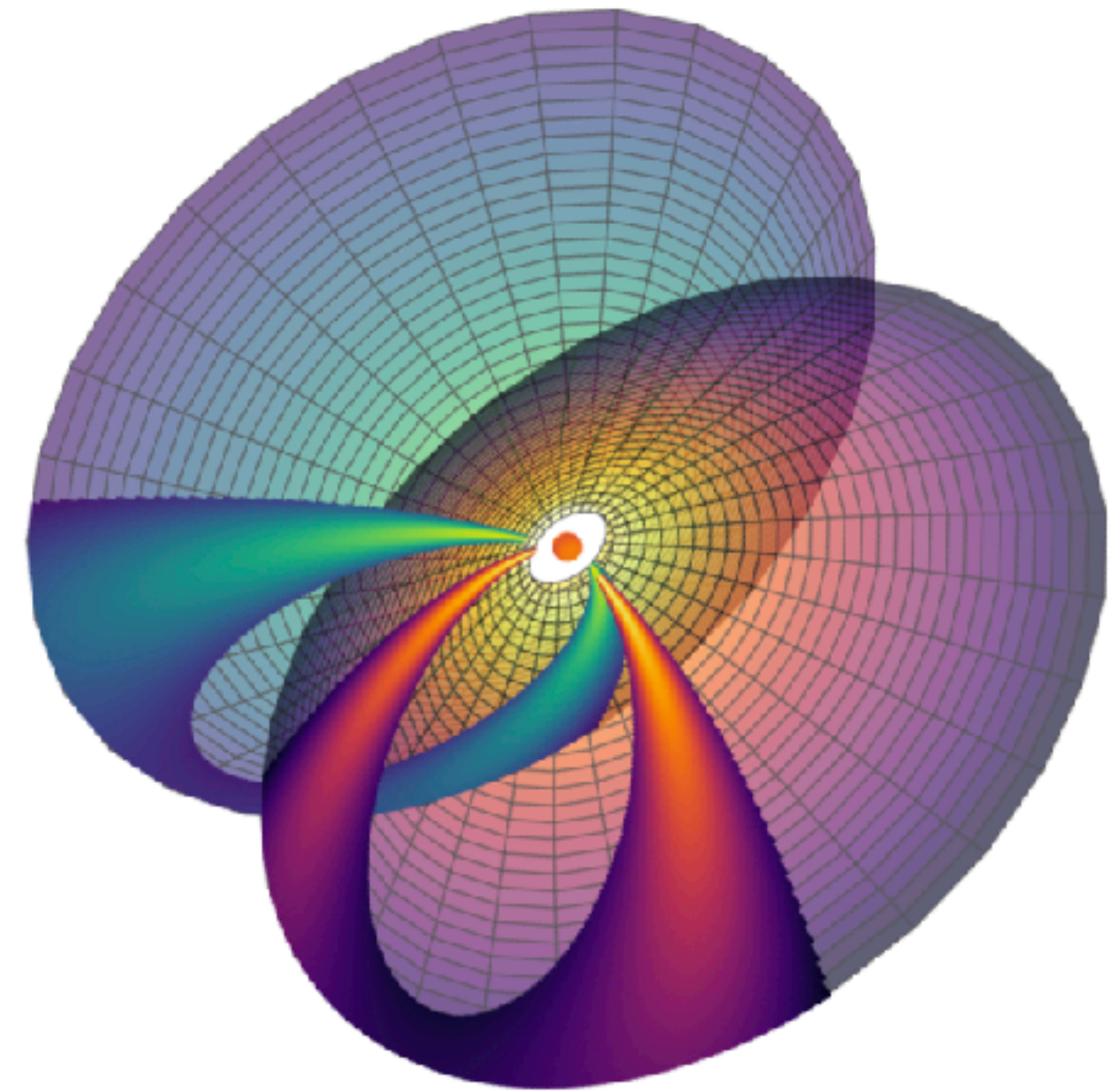
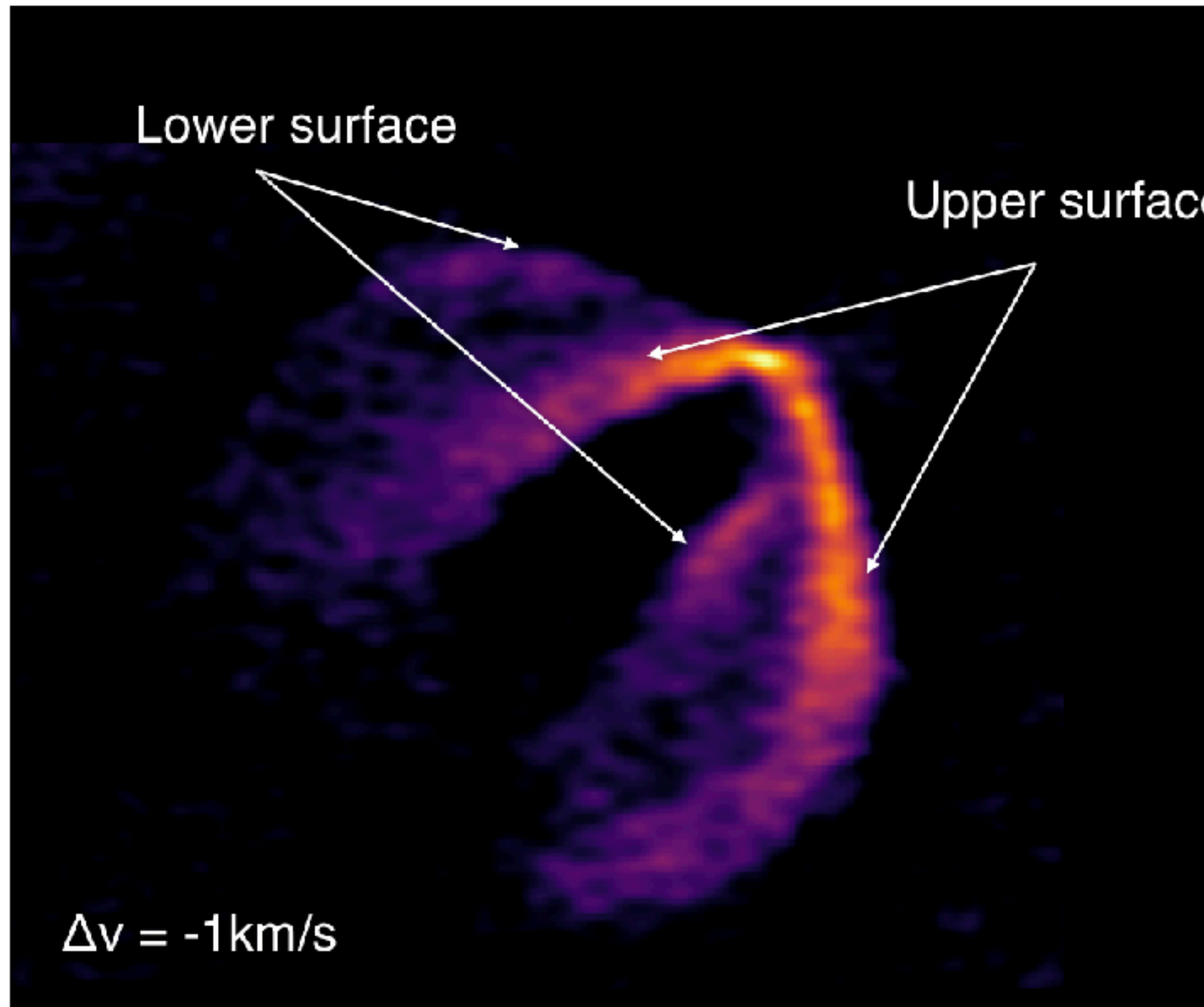
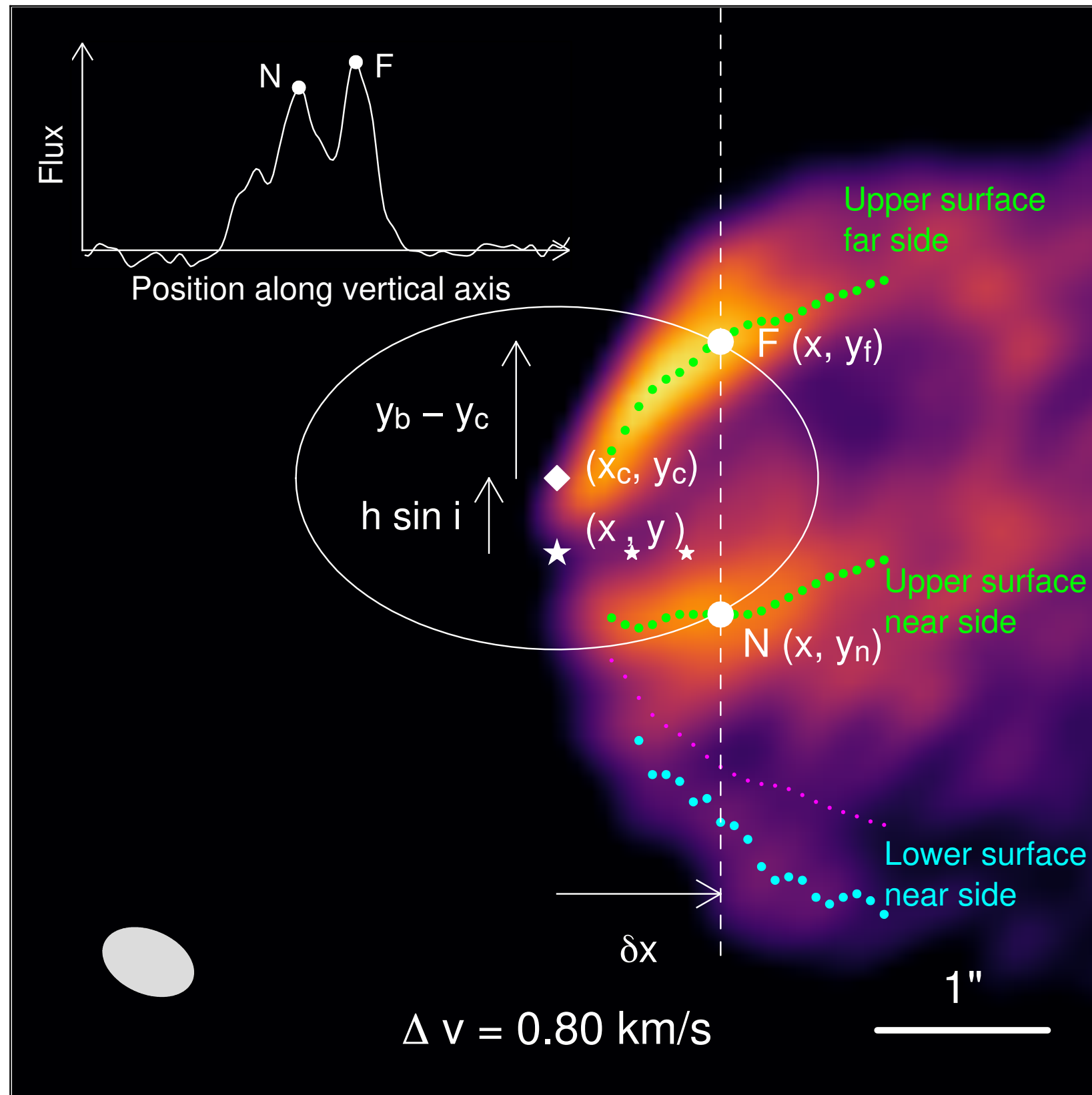


Image adapted from Pinte+2018b

# Molecular emission height



This allows to determine the emission of height of both the front and the back side of the disk, without fitting for a parametric model. Several packages are publicly available to do this for you

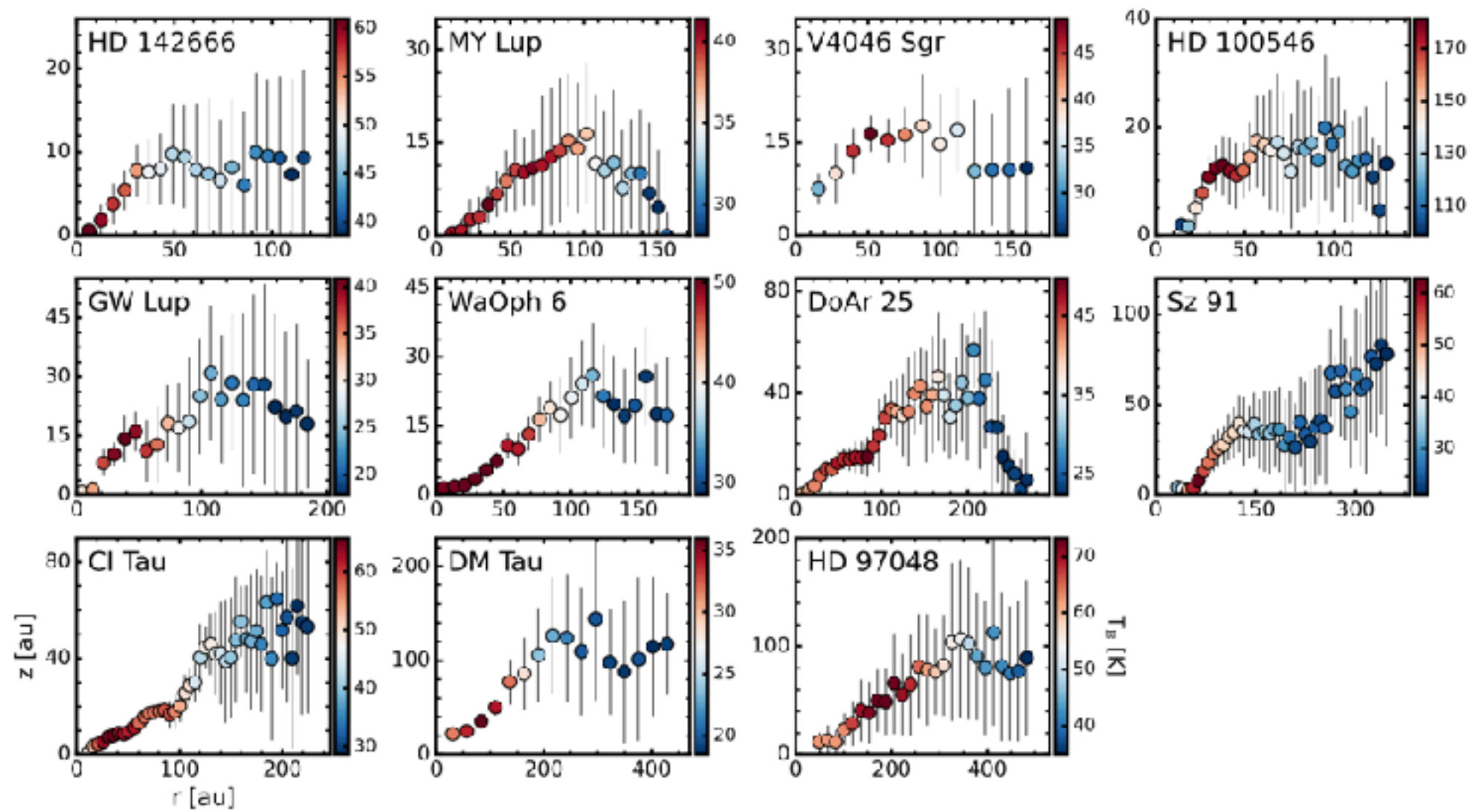
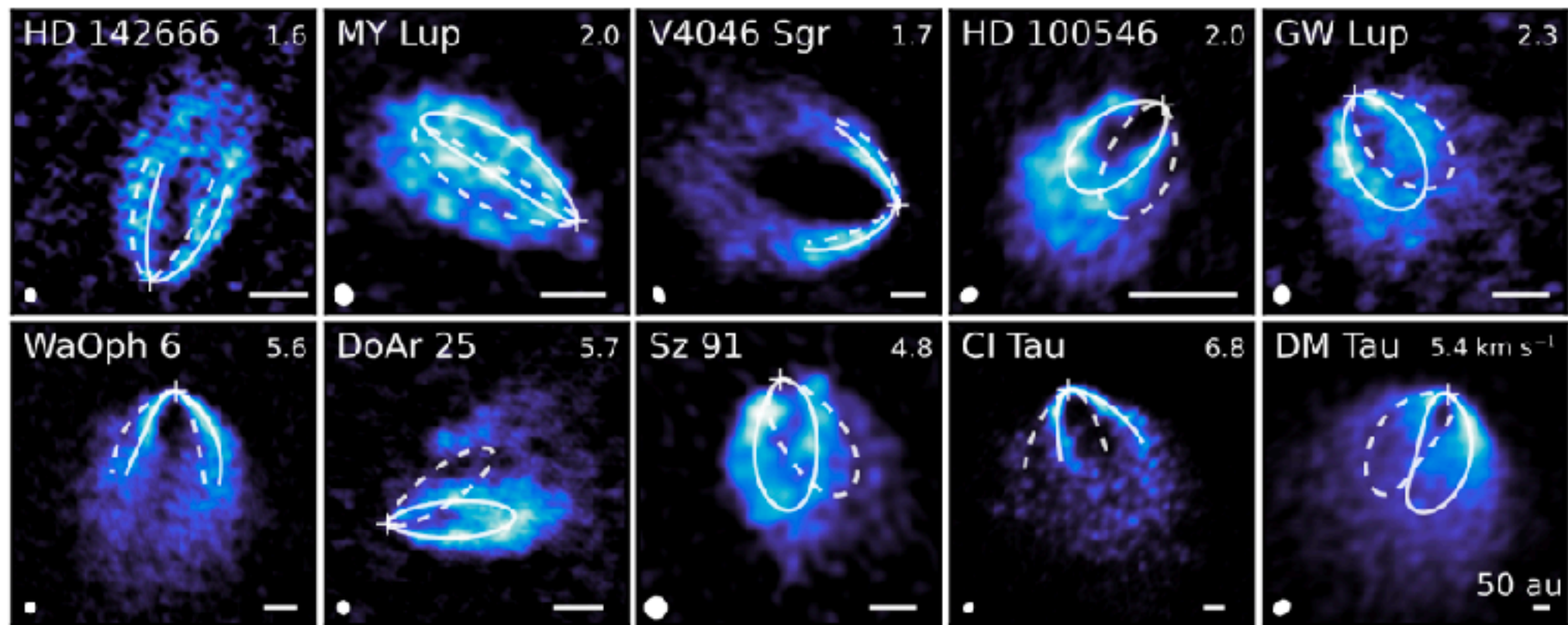
In general, we have that:

$$T_b = T_{\text{ex}}(1 - e^{-\tau})$$

For optically thick lines,  $\tau \gg 1$ . For lines

in LTE,  $T_{\text{ex}} = T_{\text{kin}}$ .

We can use multiple lines to trace the disk thermal structure!



Law+2022