# LOFAR Ultra Deep Imaging

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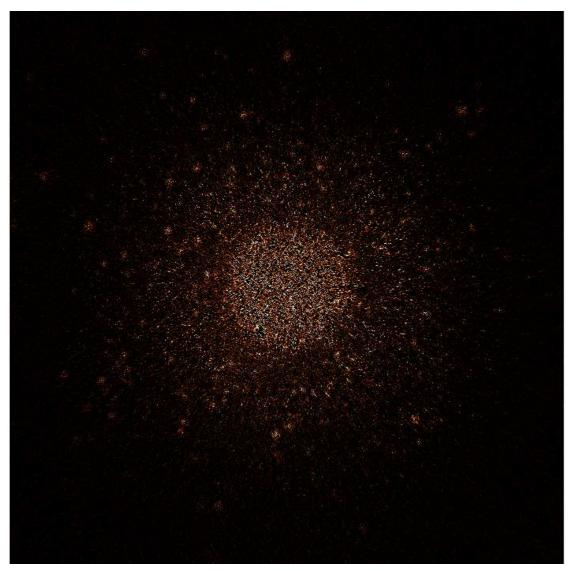
ASTRON

The Netherlands

### Deep to Ultra Deep

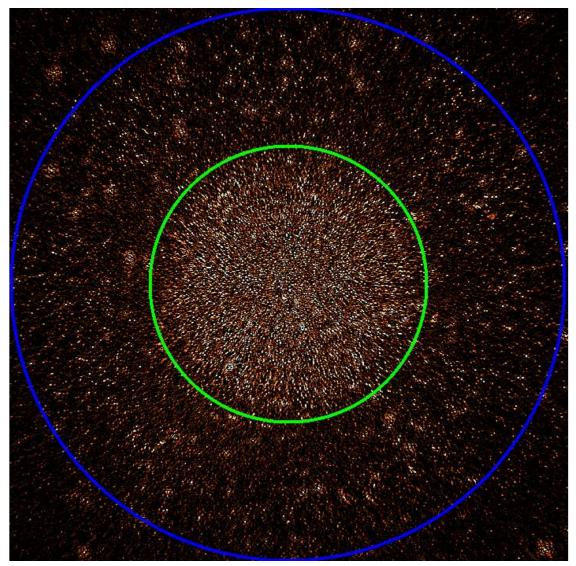
- $\Box$  LOFAR is producing good data (HBA), getting to  $\approx$  100  $\mu Jy$  noise in a single night is not difficult.
- Ultra deep imaging: going from single night to many nights, > 100 hours and reaching noise limit (Ultra deep for LOFAR should be routine for SKA).
- $\Box$  Getting down to noise, what we can do:
  - Accurate and Robust calibration: Beam, Ionosphere, Receiver: many directions.
  - Suppression of deterministic signals that act as noise (outlier sources).
  - Optimal imaging: minimize artefacts, maximize signal/noise.
- □ What we cannot have influence on: RFI, closure errors, hardware sensitivity,.....
- Key requirement is a good sky model (full sky) and Key constraint is computational cost: need to cut down processing time.

#### NCP FOV



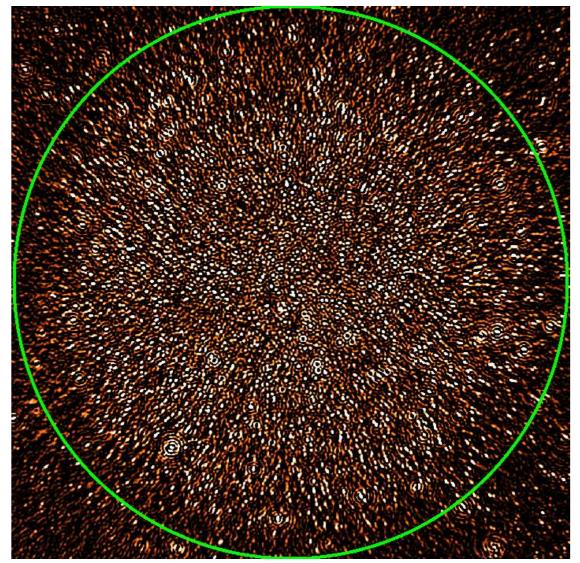
NCP 40×40 sq. deg., 150 MHz,  $30 - 1000\lambda$ , 3' PSF

#### Main FOV



First null 10 deg. diameter, second null 20 deg. diameter

#### Confusion

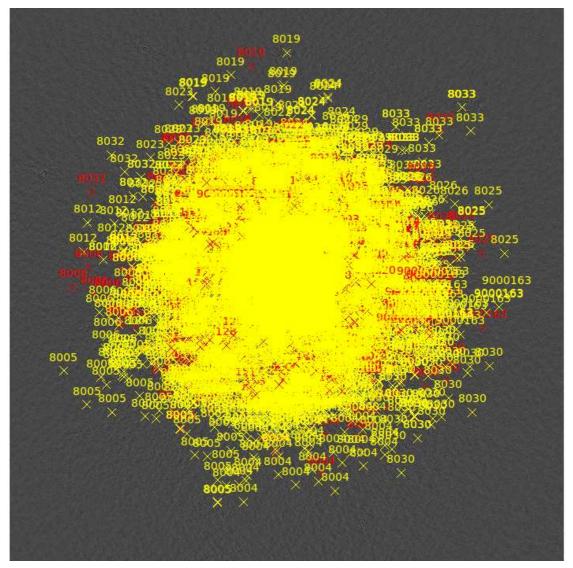


confusion limit, 3' PSF, peak 300  $\mu \rm{Jy}$  noise 60  $\mu \rm{Jy}$ 

#### **Effects of Sources**

- □ No sources in the sky  $\Rightarrow$  No problem regardless of errors due to ionosphere/beam: Root of all evil.
- □ Unsubtracted sources increase noise/confusion in residual images.
- Unmodeled sources change the noise statistics during calibration.
  Noise is not Gaussian anymore [Kazemi & Yatawatta, 2013].
- $\Box$  Non-Gaussianity  $\Rightarrow$  spikes in data after calibration, calibration artefacts in images, suppression of flux of weak sources.
- □ Will need to model about 10 000 sources for a typical LOFAR HBA observation to go ultra deep.
- $\Box$  Increasing the number of sources  $\neq$  Increasing number of degrees of freedom.
- □ Calibration satisfying all the above: SAGECal. Non-Gaussianity  $\Rightarrow$  Robust calibration, Computational cost  $\Rightarrow$  Clustering.
- 20×20 deg. FOV at 2" pixel size, need to make > billion pixel images.
  ExCon makes billion pixel images using a normal computer < 10GB memory.</li>

### NCP Sky Model



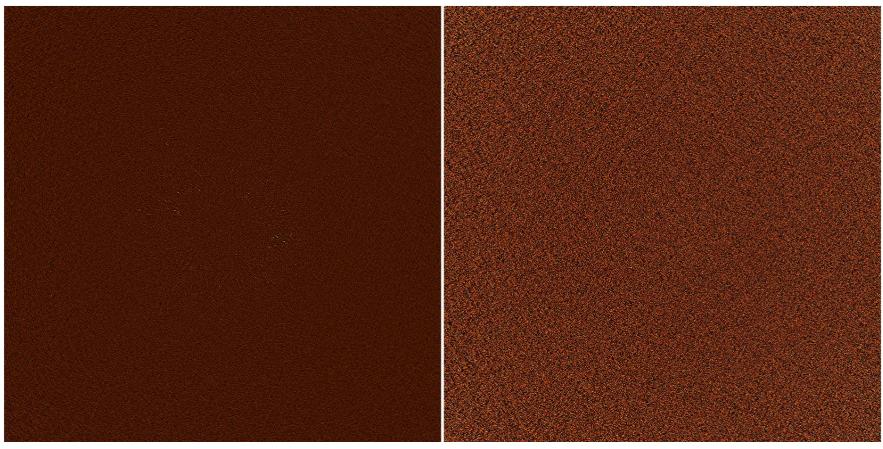
Sky model with  $> 20\ 000$  components,  $40 \times 40$  sq. deg. area

#### **Before SAGECal**



Stokes I (left) Stokes Q (right) showing sidelobes from CasA and CygA

#### After SAGECal



Stokes I (left) Stokes Q (right), after subtraction of 11,000 sources

#### Sources Outside the FOV



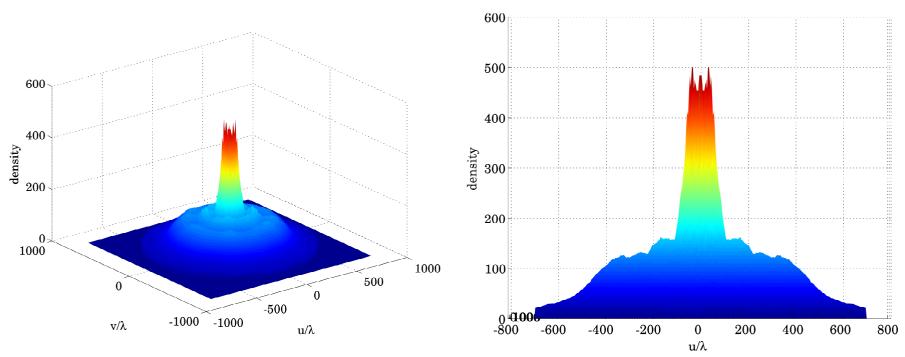
 $15 \times 15$  sq. deg., 11 000 sources subtracted using SAGECal

#### Sources Outside the FOV



15×15 sq. deg., 15 000 sources subtracted using SAGECal, same unknowns as before.

# **Optimal Imaging**



Average *uv* sampling density for full bandwidth 115-185 MHz

Optimal imaging: enhancing weak signals, minimizing PSF variation. Key elements: image weighting, data gridding.

## Image Weighting

- Natural weights: high SNR, high sidelobes; Uniform weights: low SNR, low sidelobes; Briggs weights: between uniform and natural weights.
- □ What we want: high SNR, low sidelobe variation over all frequencies and all epochs.
- □ Iterative weighting: [Pipe & Menon, 1999],[Yatawatta, 2014].
- $\Box W(k)$ : weights, C(k): convolution kernel, w(x) and c(x) their FT. Gridded weights are  $W(k) \otimes C(k)$ , and FT of this is similar to the PSF. Given an a priori function g(x) we want  $w(x)c(x) \approx g(x)$ . Convolve both sides with w(x)

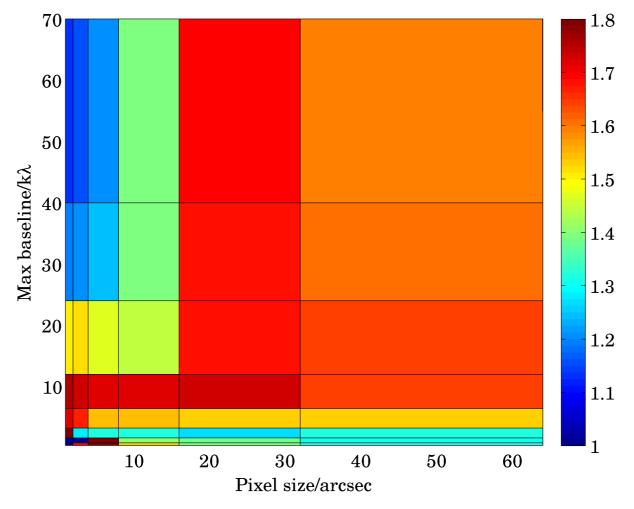
 $w(x) \otimes (w(x)c(x)) \approx w(x) \otimes g(x) \ W(k)(W(k) \otimes C(k)) \approx W(k)G(k)$ 

Both W(k), C(k) positive real,

$$W^{i+1}(k) \leftarrow \frac{W^i(k)G(k)}{(W^i(k) \otimes C(k))}$$

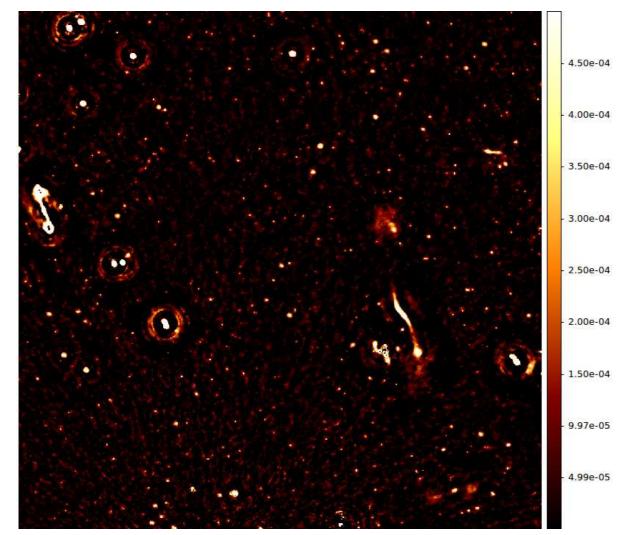
which gives W(k) to make the PSF as much as close to g(x).

## **Optimal Imaging Parameters**



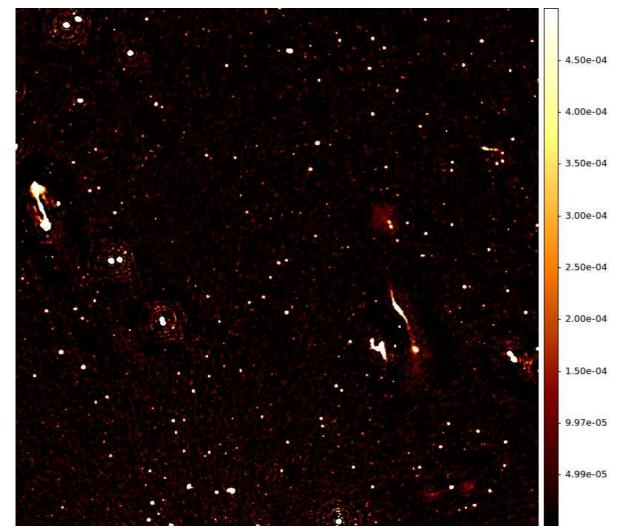
 $\sigma_I^2/\sigma_V^2$  Variance of noise in I as a fraction of noise in V

### **Deepest LOFAR Image**



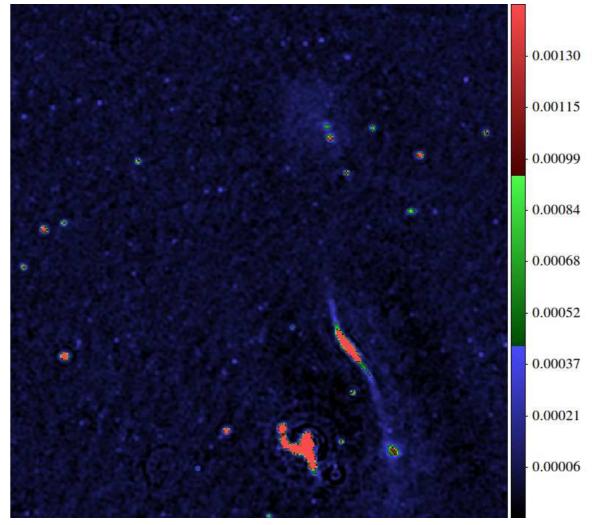
Small area at NCP at 150 MHz, 2" pixels, 25  $\mu$ Jy noise, 200 hrs data, dynamic range > 150 000 (ExCon imager)

#### **Deconvolved/Restored Image**



Deconvolution removes residual PSF, enhances resolution

## Detecting 100 $\mu$ Jy Sources



Many  $\sim$  100  $\mu$ Jy sources visible