



# LOFAR IF data processing flow

An overview

Marco Iacobelli (ASTRON)

7<sup>th</sup> LOFAR data processing school  
April 16 2024

# Outline

## Lecture

Imaging mode data editing → info & challenges

Pipeline vs workflow → def & pros/cons

Data editing flow → an overview

Focused view

## Demo

QA inspection

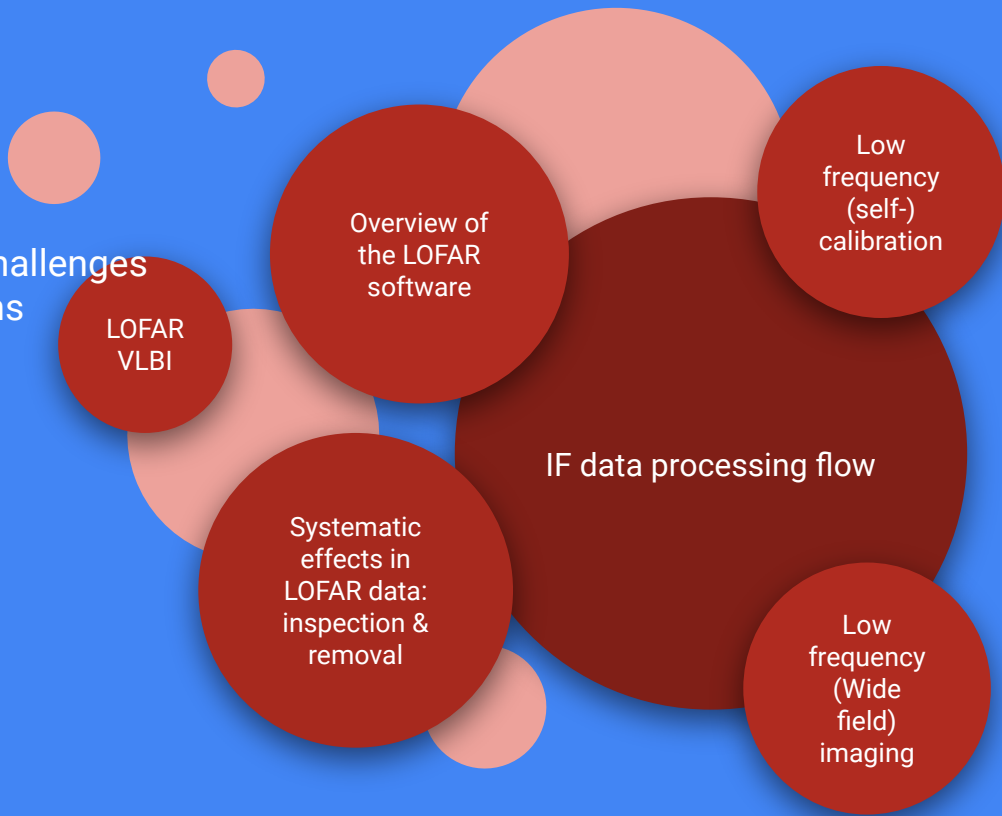
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Imaging mode data editing → info & challenges  
Pipeline vs workflow → def & pros/cons  
Data editing flow → an overview  
Focused view

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QA inspection





# A next-gen facility

LOFAR is the most flexible, complex and data-intensive radio telescope currently in existence

Generates huge amounts of data which requires a lot of supercomputing power and innovative data solutions

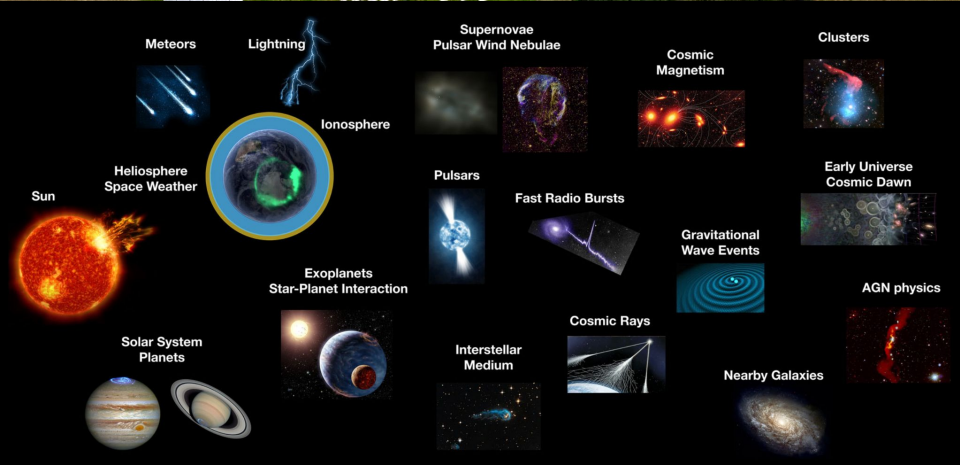


# A next-gen facility

LOFAR is the most flexible, complex and data-intensive radio telescope currently in existence

Generates huge amounts of data which requires a lot of supercomputing power and innovative data solutions

Enables astronomers to investigate a large spectrum of science use cases (from cosmology to solar-physics)

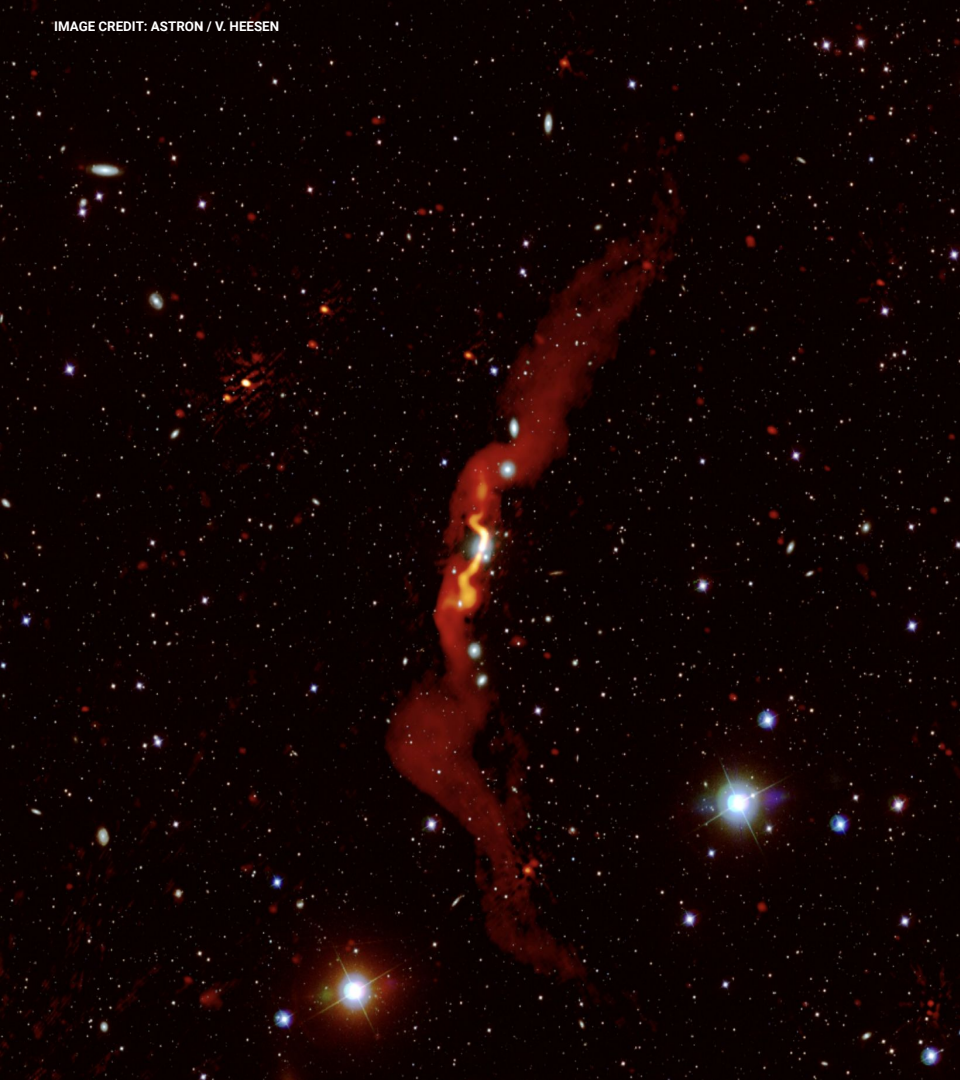


# Imaging mode data editing

(Some of the) challenges in LOFAR calibration & imaging

- Large data volumes [CAL | IMG]
- LOFAR beam(s) time dependent & difficult to model [CAL | IMG]
- Low S/N regime → calibration errors [CAL]
- Large fractional bandwidth
  - Requires multi-frequency approaches [CAL | IMG]
- Large FOV
  - Direction-dependent calibration approaches needed [CAL]
  - Large w-values [IMG]
  - Deconvolution complex [IMG]

Operation	Lecturer(s)
CAL	M. Mevius & C. Groeneveld R. van Weeren R. Timmerman
IMG	A. Offringa



# Pipeline vs workflow

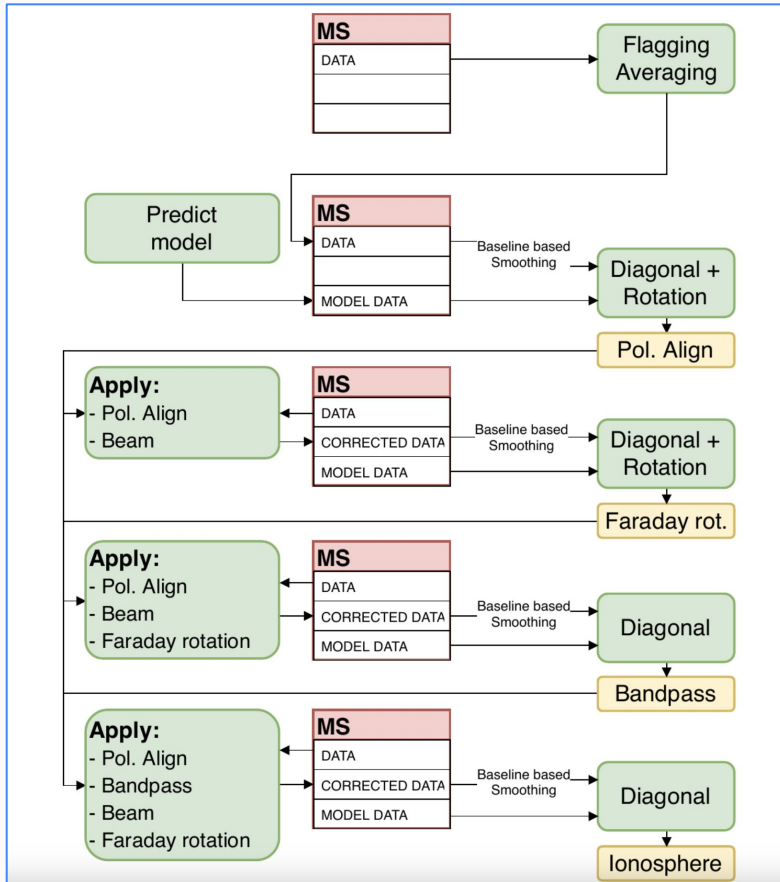
Data processing → process to generate from raw data science ready data products

# Pipeline vs workflow

Data processing → process to generate from raw data science ready data products

Pipeline → a series of processes/steps to filter or transform data

- stand alone tool





# Pipeline vs workflow

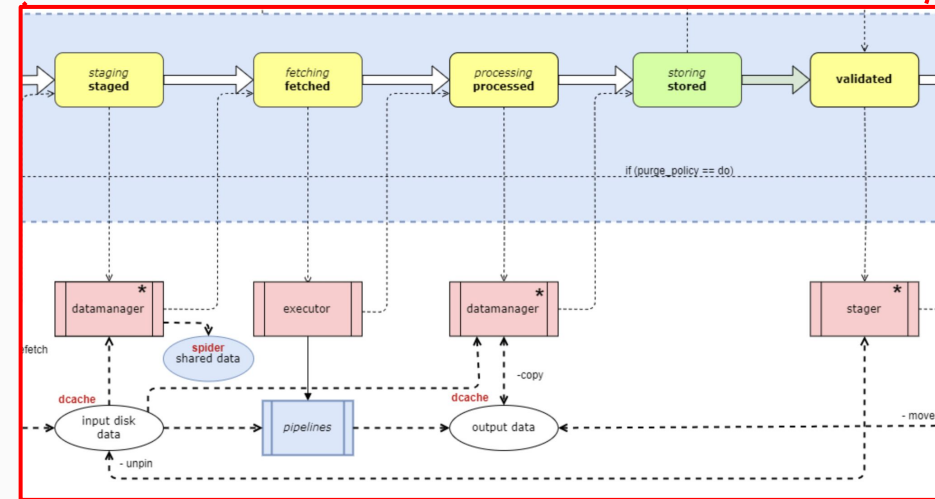
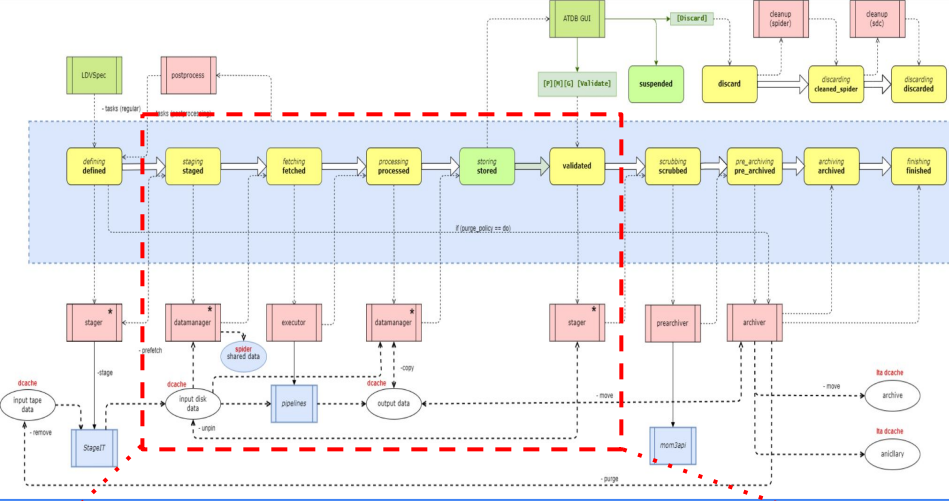
Data processing → process to generate from raw data science ready data products

Pipeline → a series of processes/steps to filter or transform data

- user stand alone tool

Workflow → pipeline(s) integrated in a data processing framework including move data from a source, to a destination, based on quality validation

- supported user service



# Pipeline vs workflow

LOFAR pipelines designed to perform an incremental data editing

- complexity (self-) calibration strategies → demanding hardware requirements
- data complexity and sizes  $O(\text{TB})$  → demanding storage requirements  $O(10\text{TB})$

# Pipeline vs workflow

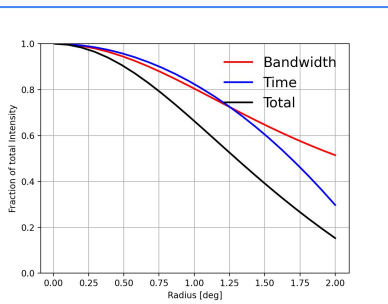
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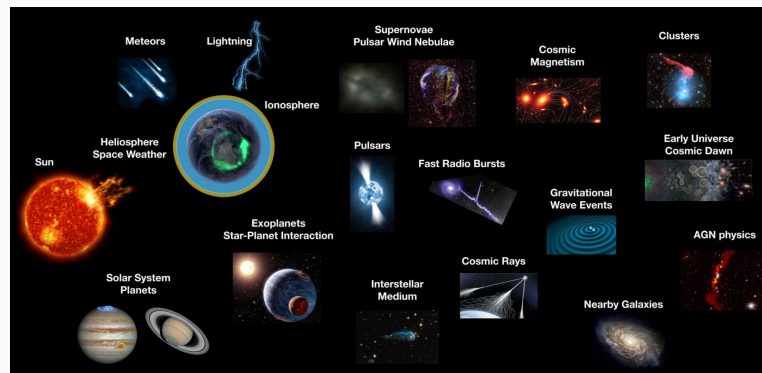
Need for multiple  
QA checkpoints



Processing strategies  
vs science use case



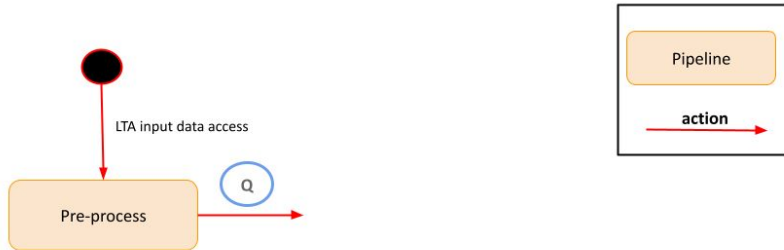
Choices at the start of the data editing constrain generation of final output → e.g. smearing



# Pipeline vs workflow

Name	Run as	CPU [hrs]   MEM budget	Life cycle phase	Notes
Pre-process	workflow	$O(10^2)$   >32 GB	Mature and supported	New version under devs
LINC HBA LINC LBA	pipeline & workflow pipeline & workflow	$O(10^3)$   >32 GB	Mature, released & supported Devs ongoing close to 1st release	<a href="https://git.astron.nl/RD/LINC">https://git.astron.nl/RD/LINC</a>
DDF-pipeline	pipeline	$O(10^4)$   >256 GB	Mature, released	<a href="https://github.com/mhardcastle/ddf-pipeline">https://github.com/mhardcastle/ddf-pipeline</a>
LiLF	pipeline	$O(10^4)$   >192 GB	Mature, released	<a href="https://github.com/revoltek/LiLF">https://github.com/revoltek/LiLF</a>
RAPTHOR HBA	pipeline & workflow	$O(10^4)$   >192 GB	Devs ongoing, released & supported	Support use of facets / screens <a href="https://git.astron.nl/RD/rapthor/-/tree/master">https://git.astron.nl/RD/rapthor/-/tree/master</a>
LOFAR-VLBI HBA	pipeline (→ workflow)	$O(10^4-10^5)$   >192 GB	Devs ongoing, released	Targeted / wide field imaging <a href="https://github.com/LOFAR-VLBI/lofar-vlbi-pipeline">https://github.com/LOFAR-VLBI/lofar-vlbi-pipeline</a>

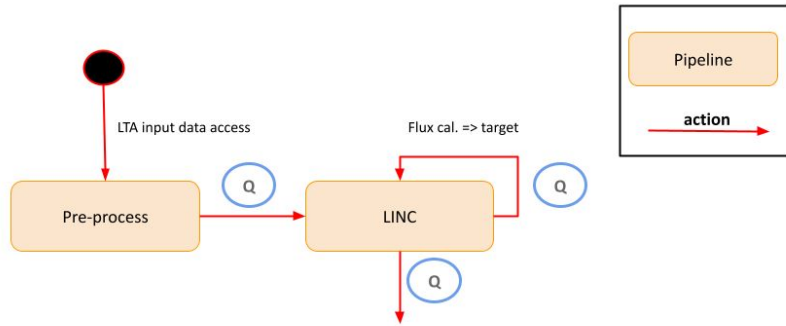
# Data editing flow: pre-process



Pre-process in LOFAR data is needed to:

- decrease data size via
  - freq./time averaging
  - [visibilities compression](#)
- removal of interfering signals
  - bright off-axis sources
  - radio-frequency interference (RFI)
- Main software packages used:
  - [Default PreProcessing Pipeline \(DPPP\)](#) to average, demix, (RFI) flag, compress

# Data editing flow: DIE cal (/img)

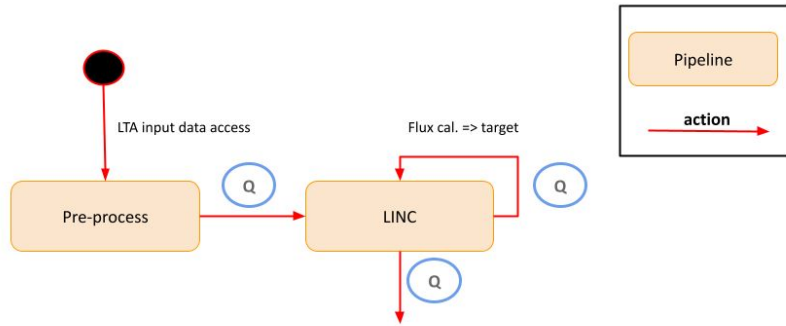


Direction-Independent Effects in LOFAR data are primarily caused by:

- The ionosphere → mostly phase effects (vary quickly in time)
  - Faraday rotation
- The instrumental effects → amplitude effects (vary slowly in time)
  - Polarisation alignment
  - Element beam
  - Bandpass
  - Clock drift

Direction-Independent calibration (mainly) attempts to correct for these effects

# Focused view: LINC

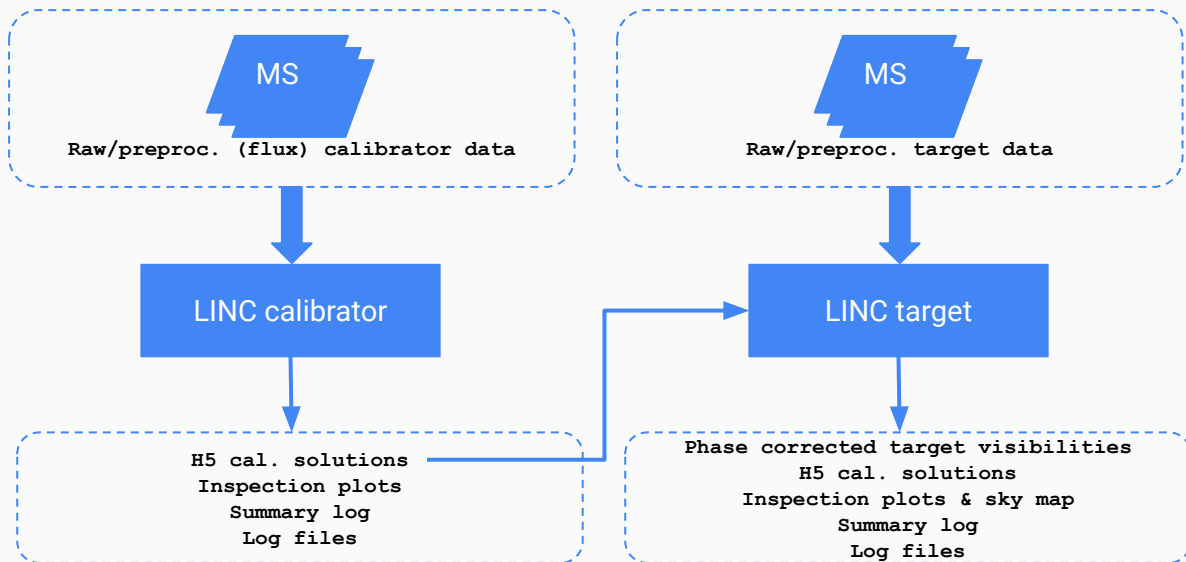


LINC perform Direction-Independent cal. (& img.)

- Based on the unified-calibration scheme of [de Gasperin et al. \(2019\)](#)
- Supports multi-epoch datasets (interleaved or multiple nights)
- Prepare data to use any DDE calibration software (e.g RAPHOR, DDF-pipeline, LOFAR-VLBI)
- Main software packages used:
  - [Default PreProcessing Pipeline \(DPPP\)](#) to average, flag, calibrate, apply calib. solutions
  - [LOFAR Solution tools \(LoSoTo\)](#) to analyse/extract parameters from calib. solutions

# Focused view: LINC

LINC perform Direction-Independent cal. (& img.)

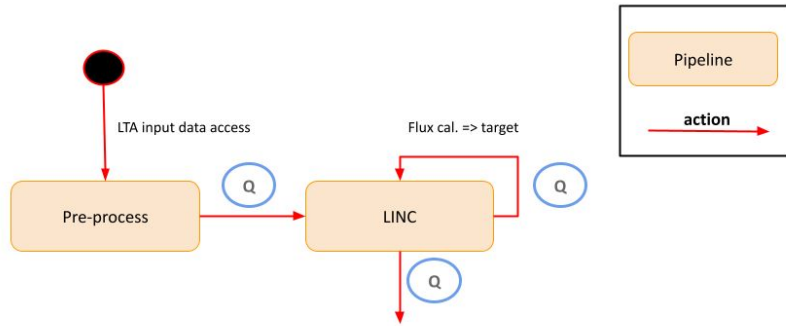


Pipeline consists of 2 workflows:

- LINC calibrator: processes the (flux) calibrator to derive DIE corrections.
- LINC target: Transfers the DIE corrections to the target; does phase self-calibration of the target.
- DIE calibrated target visibilities to be used for further DDE processing.



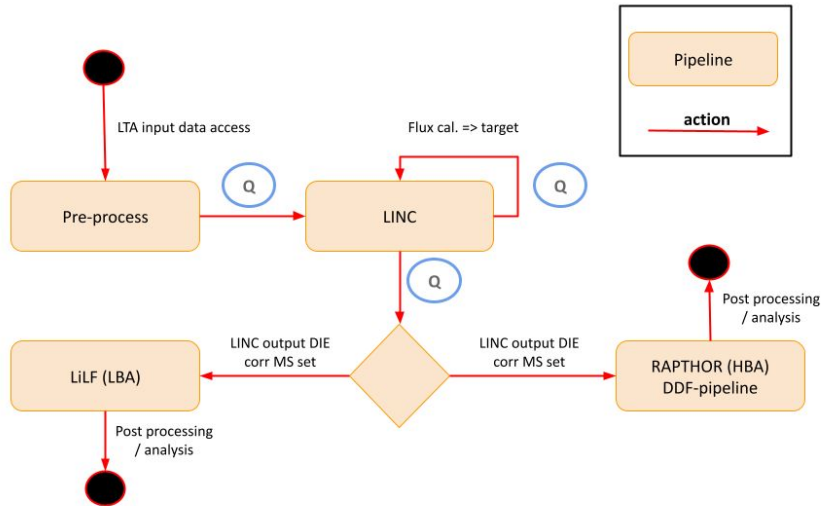
# Focused view: LINC



[LINC](#) perform Direction-Independent cal. (& img.)

- LINC uses CWL pipeline framework as backend:
  - Allows distribution over cluster nodes
  - Allows resuming of interrupted jobs
  - Integrated Docker support

# Data editing flow: DDE cal/img

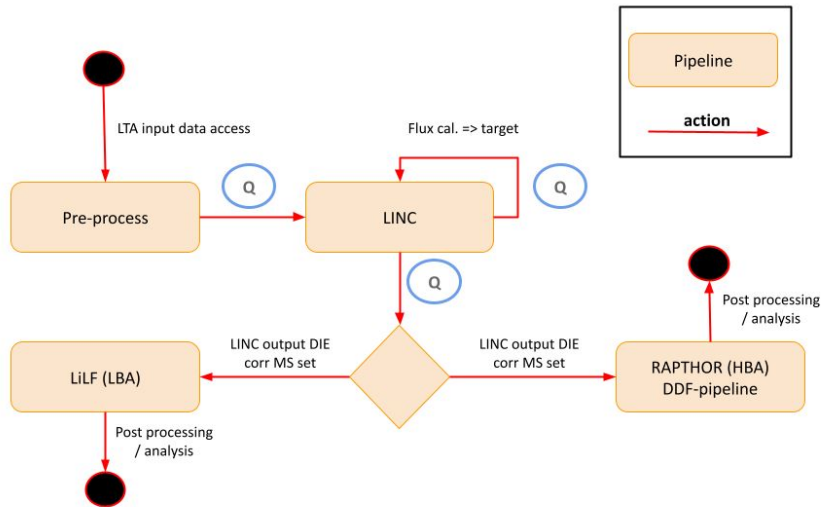


Direction-Dependent Effects in LOFAR data are primarily caused by:

- The ionosphere → mostly phase effects (vary quickly in time)
  - Dispersive delays
- The LOFAR beam → mostly amplitude effects (vary slowly in time)
  - Dipole beam & array factor

Direction-Dependent calibration (mainly) attempts to correct for these effects

# Focused view: RAPHOR



[RAPHOR](#) performs CS&RS array Direction-(In)Dependent calib. & img.

- Based on the calibration scheme of [de Gasperin et al. \(2020\)](#)
- Supports multi-epoch datasets (interleaved or multiple nights)
- Designed to operate on HBA and LBA data
- Enable full-field of view / targeted processing
- Sub-optimal for:
  - very extended (e.g.  $\geq 1$  deg) target sources (i.e.  $>1$  facet needed)

MS

LINC HBA DIE corr.  
target data

Sky  
mod.

Target data FoV  
sky model

Data  
preparation

Define DDE  
calibrators

Calibrate

RAPTHOR

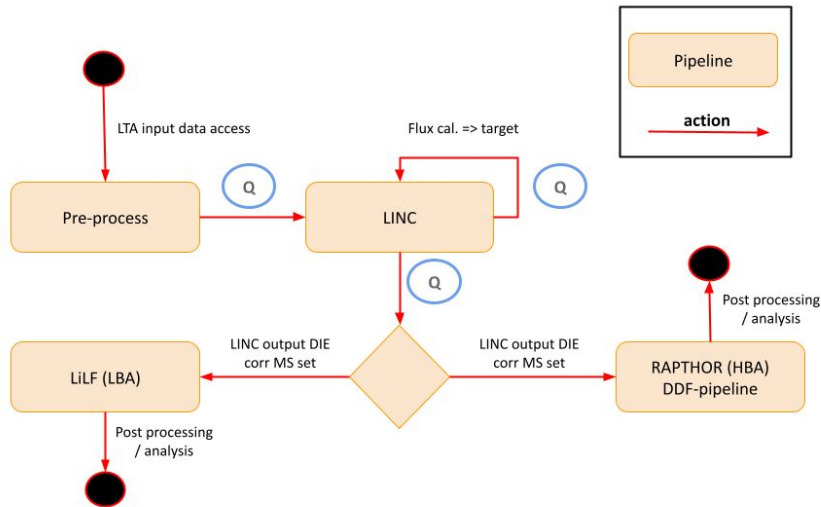
Predict

Image

# Focused view: RAPTHOR

- Get list of DDE calibrators from sky model
  - Divide field into facets
- Iterative self-calibration:
  - Performed in multiple directions (facets) simultaneously
  - Each facet gets a single calibration solution
  - Designed to enable usage of 2-D screens for both CAL & IMG (in progress)
  - Get a sky model to (eventually) loop

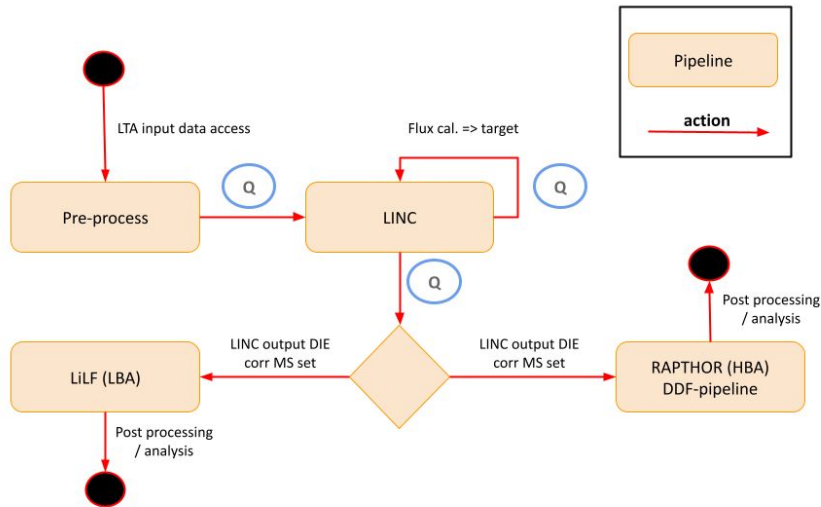
# Focused view: RAPHOR



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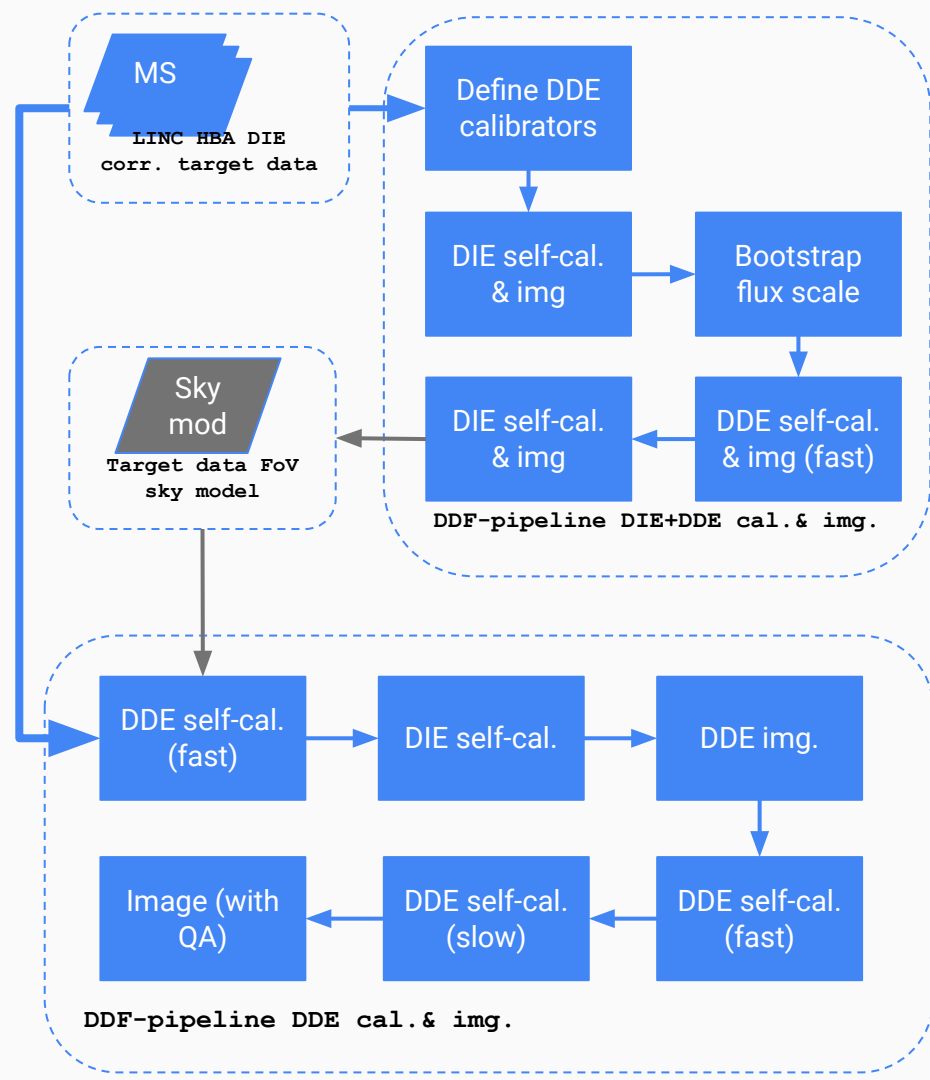
- Uses a Python wrapper around CWL pipelines as backend:
  - The wrapper sets up & executes the pipelines as “operations” to perform the actual processing
  - Allows distribution over cluster nodes
  - Allows resuming of interrupted jobs
- Main software packages used:
  - [Default PreProcessing Pipeline \(DPPP\)](#) to average, flag, calibrate, apply calib. sols
  - [LOFAR Solution tools \(LoSoTo\)](#) to analyse/extract parameters from calib. sols
  - [WSClean](#) to apply calib. sols & perform imaging

# Focused view: DDF-pipeline



[DDF-pipeline](#) performs CS&RS array Direction-(In)Dependent calib. & img.

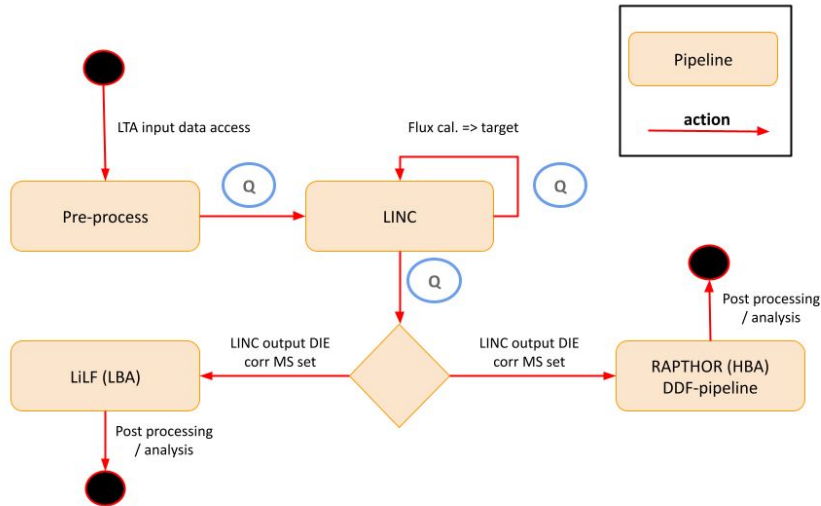
- Based on the calibration scheme of [Tasse et al. \(2021\)](#)
- Supports multi-epoch datasets (interleaved or multiple nights)
- Designed to operate on HBA data
- Recommended for full-field of view processing



# Focused view: DDF-pipeline

- Sub-dataset self-cal. & imaging:
  - Get DDE calibrators & facets
  - DIE self-cal. & imaging
  - DDE self-cal. (phase only) & img.
  - DIE self-cal. & imaging
  - Improved DIE solutions & sky model
- Full dataset self-cal. & imaging:
  - DDE+DIE self-cal.
  - DDE imaging
  - Fast DDE self-cal.
  - Slow DDE self-cal.
  - Full field imaging (& quality checks)

# Focused view: DDF-pipeline

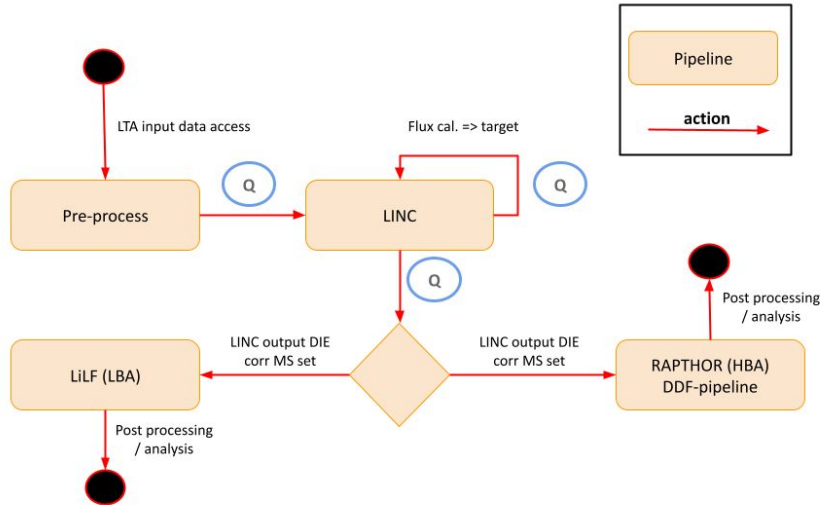


[DDF-pipeline](#) performs CS&RS array Direction-(In)Dependent calib. & img.

- Uses a Python for both backend and frontend:
  - Allows distribution over cluster nodes
  - Allows resuming of interrupted jobs
- Large resources required: 32 cores, 192 GB memory, 10TB of disk space
- Many software packages used:
  - DDFacet
  - KillMS



# Focused view: LiLF



[LiLF](#) performs CS&RS array Direction-(In)Dependent calib. & img.

- Based on the calibration scheme of [de Gasperin et al. \(2020\)](#)
- Supports multi-epoch datasets (interleaved or multiple nights)
- Designed to operate on LBA data
- Enable full-field of view / targeted processing
- Sub-optimal for:
  - LBA data <30 MHz

# Focused view: LILF

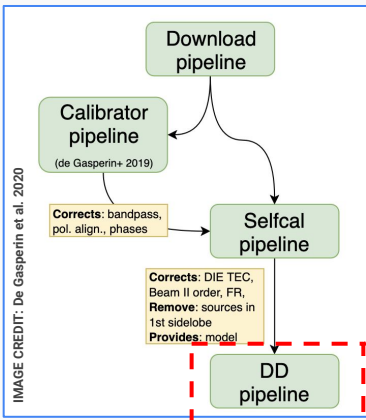
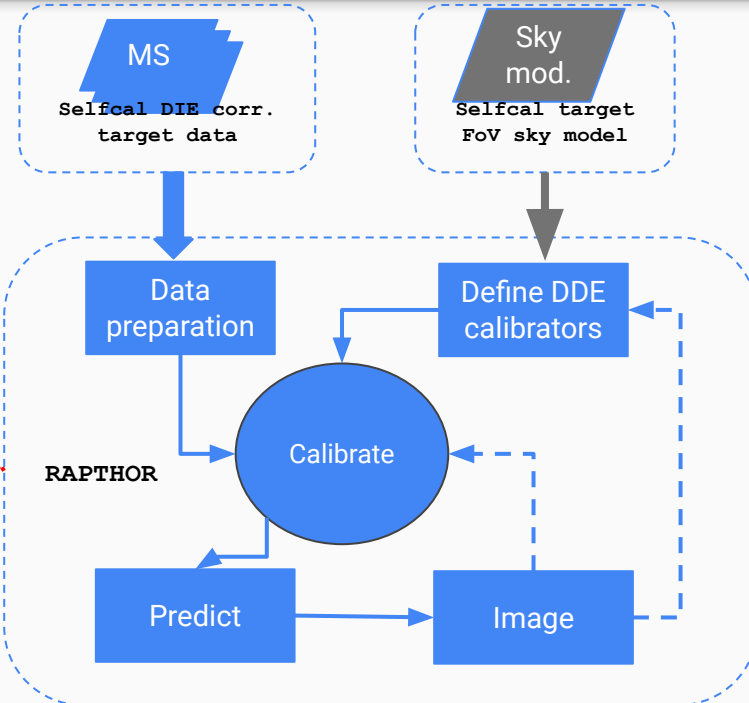
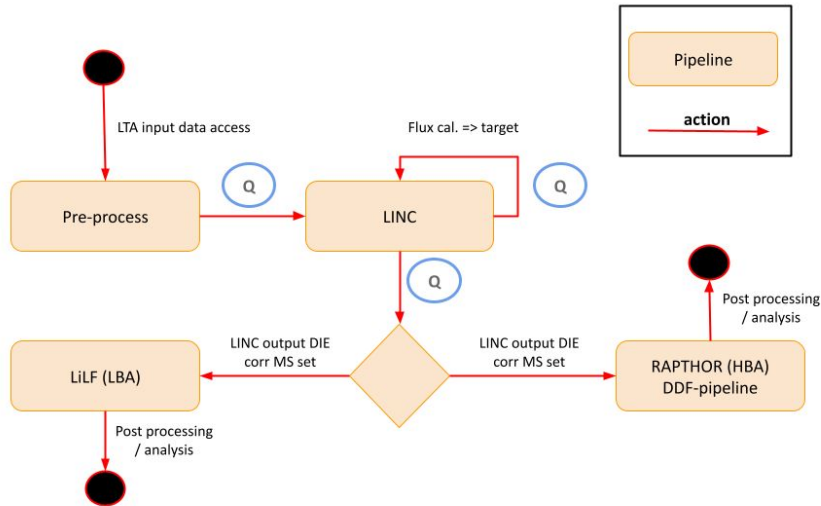


IMAGE CREDIT: De Gasperin et al. 2020



- Get list of DDE calibrators from sky model
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- Iterative self-calibration:
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  - Each facet gets a single calibration solution
  - Get a sky model to (eventually) loop

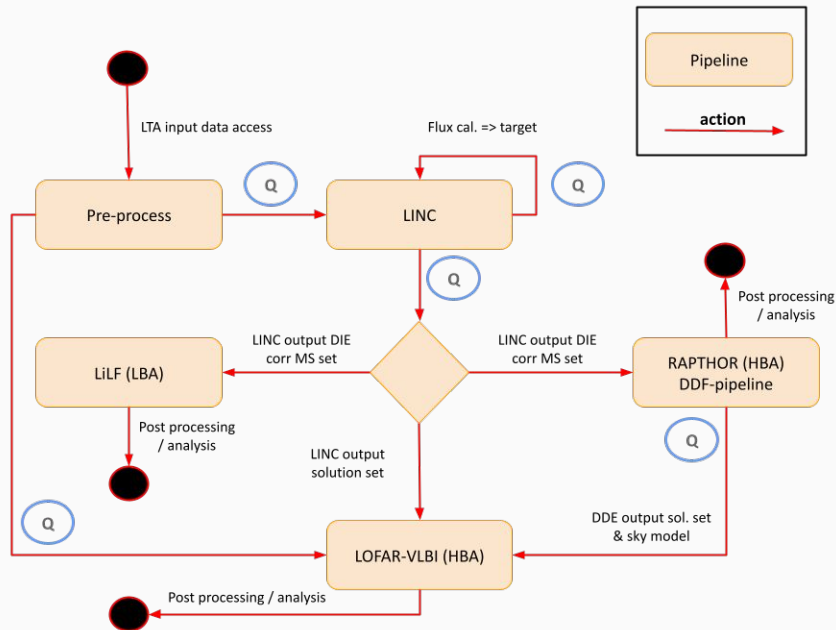
# Focused view: LiLF



[LiLF](#) performs CS&RS array Direction-(In)Dependent calib. & img.

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# Data editing flow: DDE cal/img (VLBI)

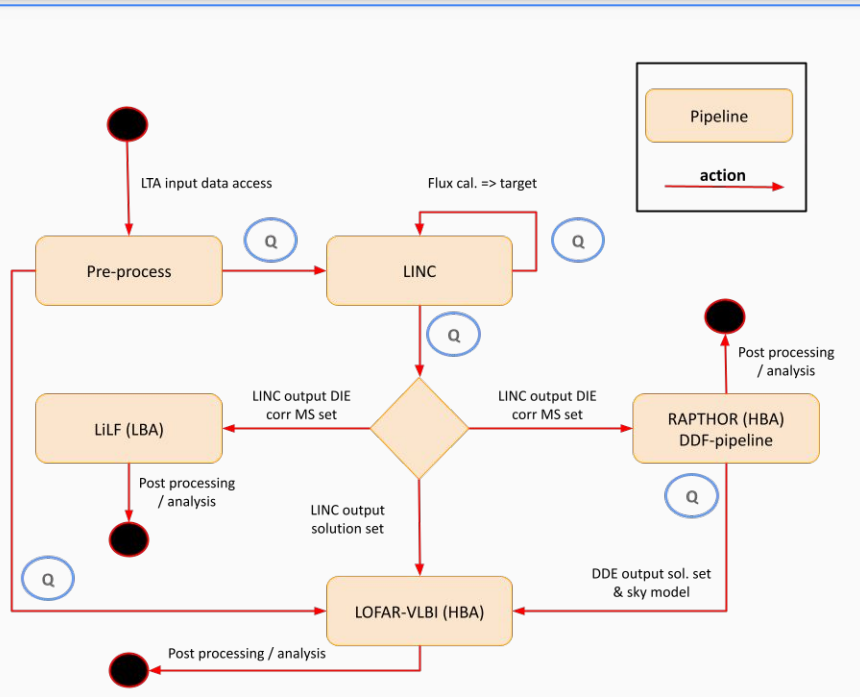


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  - Dipole beam & array factor

Direction-Dependent calibration (mainly) attempts to correct for these effects

# Focused view: LOFAR-VLBI



[LOFAR-VLBI](#) performs full array Direction-(In)Dependent calib. & img.

- Based on the VLBI principles & LOFAR adapted scheme of [Morabito et al. \(2021\)](#) → see also [Sweijen et al. 2022](#) and [Ye et al. 2024](#)
- Supports multi-epoch datasets (interleaved or multiple nights)
- Designed to operate on HBA data
- Recommended for targeted exposures
  - full-field of view intensive processing
- Sub-optimal for:
  - faint (i.e.  $S/N < 10$ ) target sources away (i.e.  $> 1.5 \text{deg}$ ) from the delay-calibrator

MS

Raw/preproc. target data

H5  
Cal.  
sol.

DDF  
Cal.  
sol.

LINC HBA (DIE) cal. solutions  
DDF (DDE) cal. solutions OPTIONAL

Delay-Calibration

Data  
preparation

Get best  
in-field  
calibrator

Remove  
dispersive  
delays

Split-Directions

Loop over  
DOIs for  
self-cal & img

# Focused view: LOFAR-VLBI

- apply solutions
- build a list of potential in-field calibrators
- for the best guessed in-field calibrator:
  - phase-shift to the direction
  - average time/freq
  - correct beam array-factor
  - combine CS into a ST & remove CS
- solve for dispersive delays (dTEC)

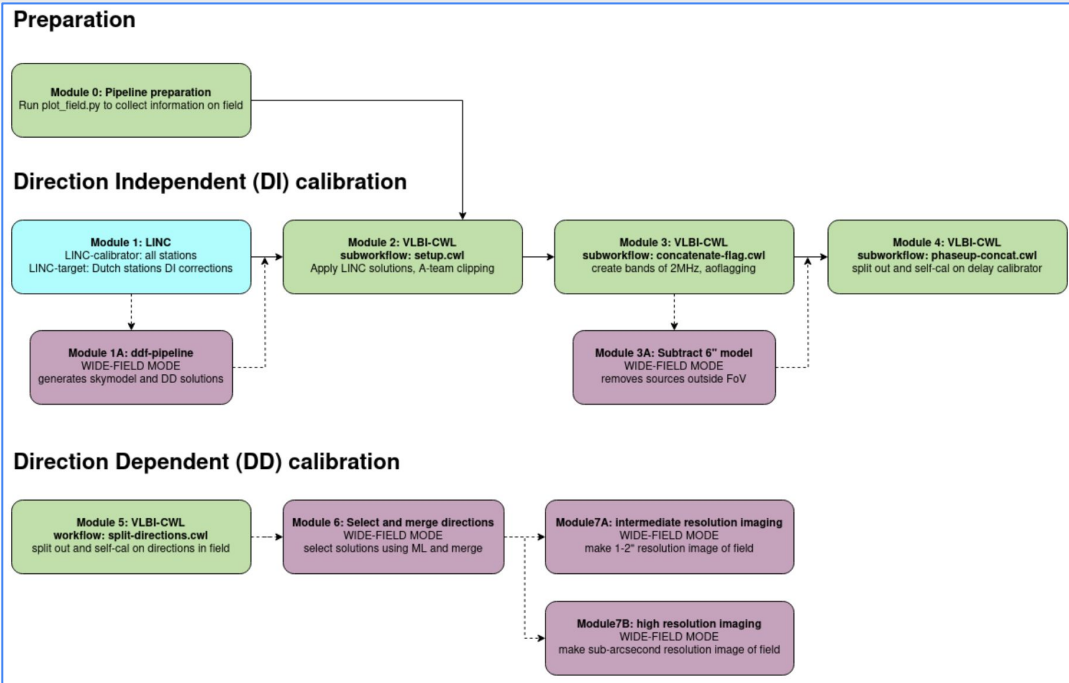
$$\Delta\phi_{\nu,t} = \phi_0 + \left( \frac{d\phi}{d\nu} \Delta\nu + \frac{d\phi}{dt} \Delta t \right)$$

Delay

Rate

- apply delay calibrator solutions
- for the selected DOIs:
  - phase-shift to the direction
  - solve for residual dispersive delays
  - self-cal (amp.&phase) with imaging

# Focused view: LOFAR-VLBI



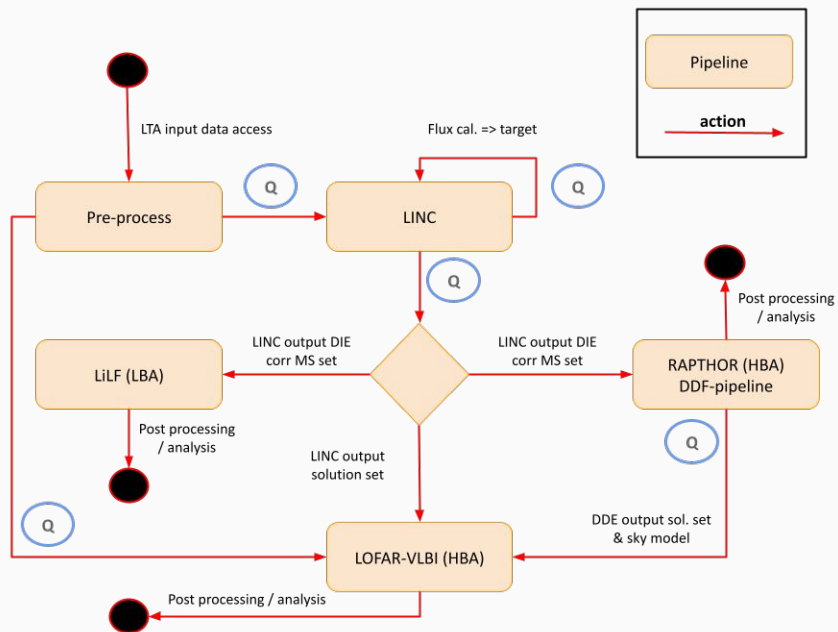
[LOFAR-VLBI](#) performs full array Direction-(In)Dependent calib. & img.

For WIDE-FIELD MODE dependency on ddf-pipeline

Mandatory step before any data access / editing is to run the `plot_field.py` script to:

- query online LotSS & LBCS databases to construct catalogues of sources in the field
- provide a short summary of the observation parameters → help the user understand if the data is suitable for LOFAR-VLBI processing !

# Focused view: LOFAR-VLBI

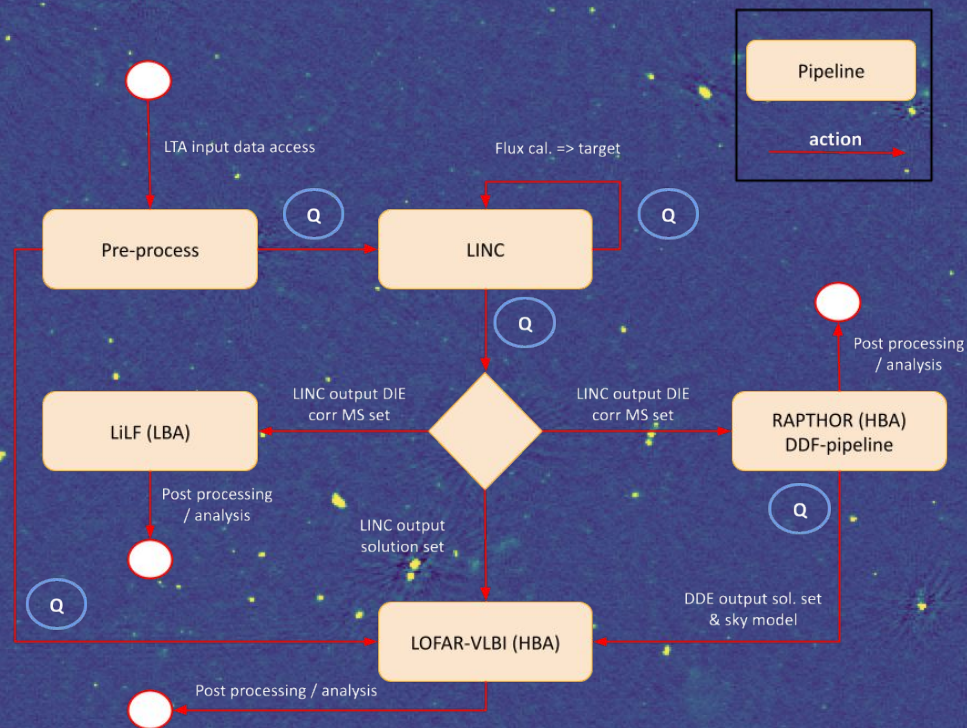
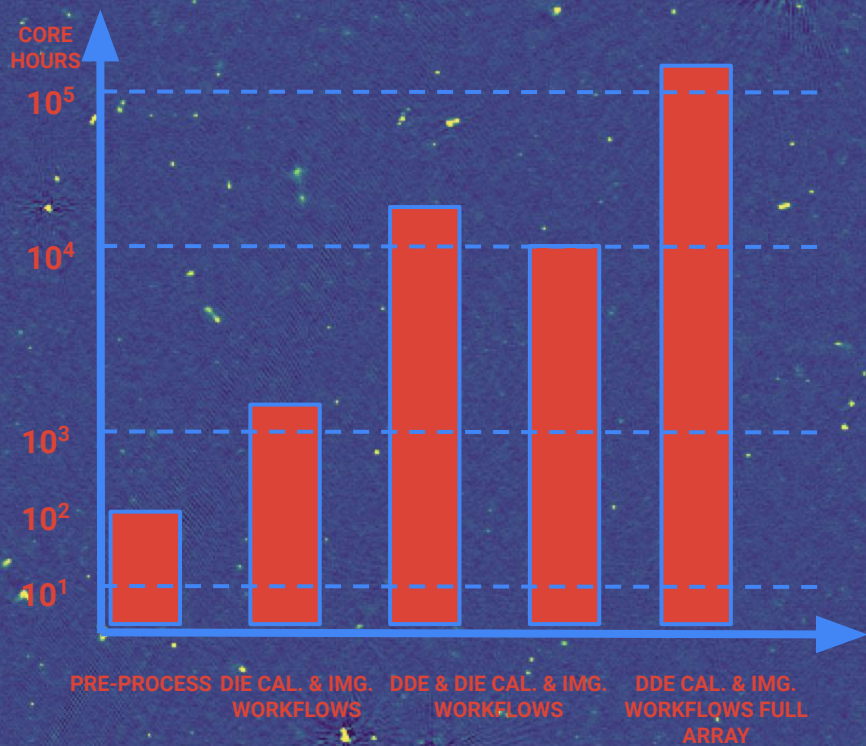


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# Take home messages . . .





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