

# System Agnostic Data Reductions for Astronomy

Sphesihle Makhathini

UNIVERSITY OF THE  
WITWATERSRAND,  
JOHANNESBURG



100  
1922  
2022

# Astronomy Software



- 01 | Often written by astronomers, not software developers. Unnecessarily complex and opaque
- 02 | Uses non-standard libraries. Difficult to build and/or install
- 03 | Difficult to install multiple packages on the same system
- 04 | No cohesive development
  - Libraries
  - User interface
  - Configuration files
- 05 | The result is clunky and unreliable software, scripts and pipelines that produce unreliable scientific products. More importantly, it's difficult to check whether some of the results are reproducible.



# How can we fix this?



2-5

Result from 1



1

Not likely to change.



2-4

Can be fixed for pipelines through **stimela**.



# stimela



Python-based (now Yaml) based framework for writing data reduction pipelines.

<https://stimela.readthedocs.io/>

## Nomenclature

### Cab

A self contained unit that can perform a **well defined** task on some input and produce some output

### Step

An instance of a cab or recipe.

### Recipe

A set of steps that perform a **well defined** task.

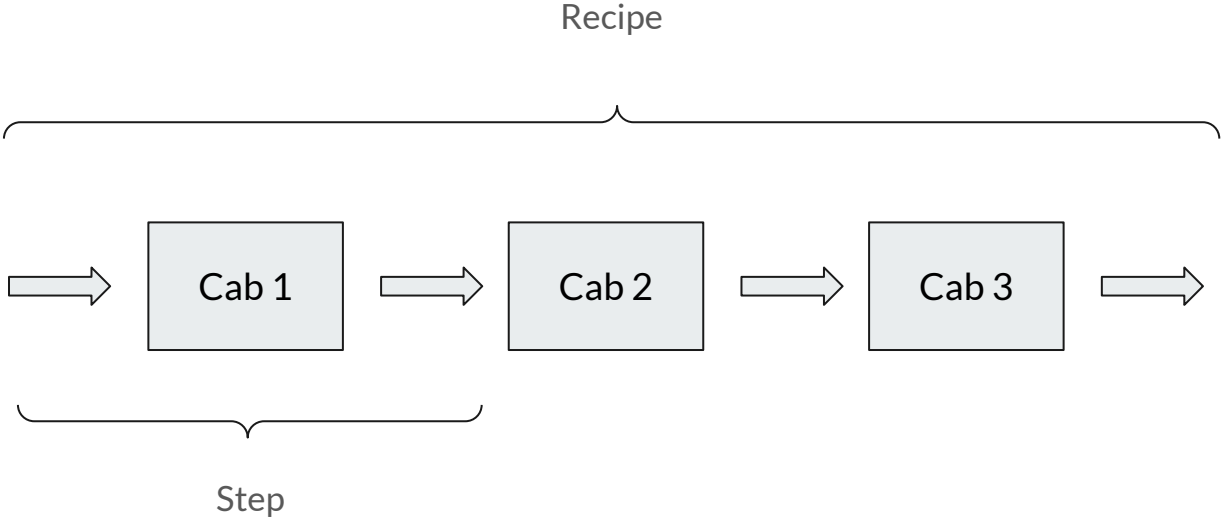
### Well defined

Produces a **predictable and reproducible** output given the same set of inputs.

### Containerization

OS-level virtualization that allows applications to run in isolated user spaces called **containers (or images)** in any cloud or non-cloud environment, regardless of type or vendor.

# Cabs, Steps and Recipes



# Anatomy of a Cab

```
4 cabs:
5   fitstool.stack-freq-cube:
6     info: Uses Owlcat fitstool.py (https://github.com/ratt-ru/owlcat) to stack a frequency cube
7     command: fitstool.py
8     image:
9       _use: vars.cult-cargo.images
10      name: python-astro
11     inputs:
12       images:
13         dtype: List[File]
14         required: true
15         policies:
16           positional: true
17           repeat: repeat
18     outputs:
19       cube:
20         dtype: File
21         policies:
22           positional: true
23         format: '--stack={0}:FREQ'
```

Input definition

- Operating System (can be host)
- Libraries
- Application or script

Output definition

# Anatomy of a Recipe

```
calibration-recipe:
  info: "a notional recipe for calibration & imaging"

  # this recipe has some input parameters
  inputs:
    ms:
      dtype: MS
      required: true
      info: "measurement set to use"
    image-name:
      dtype: str
      required: true
      info: "base name for output images"
    image-size:
      dtype: int
      default: 4096
      info: "image size, in pixels"
```

```
steps:
  image:
    info: "make initial image and model from DATA column"
    # this is the underlying tool that the step invokes (defined in my
    cab: imager-tool
    # and these are the parameters of the step...
    params:
      ms: =recipe.ms
      mode: image
      size: =recipe.image-size * 2
      column: DATA
      output.image: '{recipe.image-name}.image-{info.suffix}-{current_step}'
      output.model: '{recipe.image-name}.model-{info.suffix}.fits'
  predict:
    info: "predict model into MODEL_DATA"
    cab: imager-tool
    params:
      ms: =recipe.ms
      mode: predict
      model: =previous.output.model
      column: MODEL_DATA
```

# CARACal

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## Containerized Automated Radio Astronomy Calibration

<https://caracal.readthedocs.io/>



- Radio Interferometry (RI) data reduction pipeline
  - Not just for MeerKAT
- Continuum + line data
- Simple to install, and use
- Configurable
- Stimela-based
  - Portable
  - System agnostic
  - Reproducible results

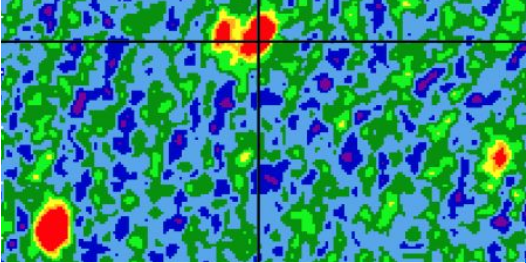


# About CARACal



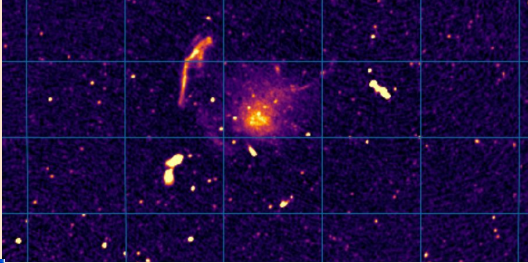
- End-to-End data reduction pipeline
- Well defined set of stimela recipes (called workers)
- Each worker performs a task along the process chain
- Only requires Python and a containerization tool (Singularity, Podman, Docker)
  - No need to install any other software
  - The software are pulled from an online container/image repository and come fully equipped with required libraries and applications
- Allows astronomer to focus on optimizing data reduction settings instead of spending hours setting up the perfect software environment.
- Portable and System Agnostic
  - Share reductions with collaborators via Yaml files. No bash scripts, no Make files
  - Run CARACal with **same configuration file on same data**, and get the **same results** regardless of host system.

# Lowers barrier to entry for students



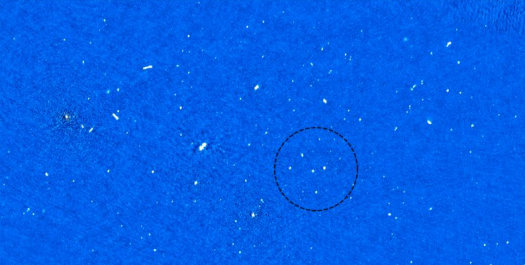
**Sinenhlanhla Sikhosana (UKZN, PhD, IP)**

Diffuse radio emission in ACTPol clusters  
(UKZN, PHD,



**Julia Healy (Kapteyn/UCT, PhD, IP)**

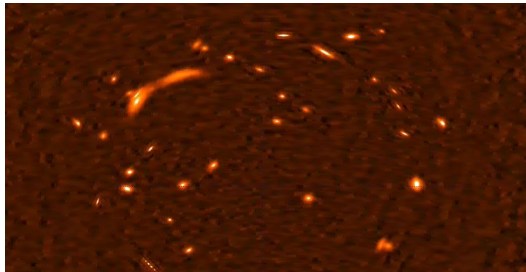
Galaxies in cluster substructures (Norma and Abel2626)



**Shilpa Ranchord (UP, MSc, IP)**

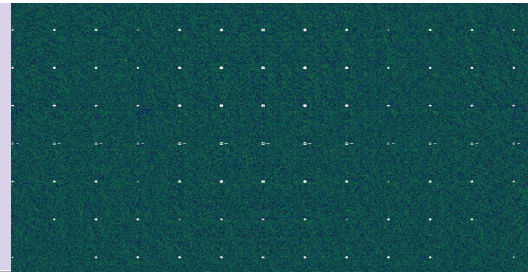
Strong gravitational lensing of HI with galaxy clusters: a deep MeerKAT search

# Lowers barrier to entry for students



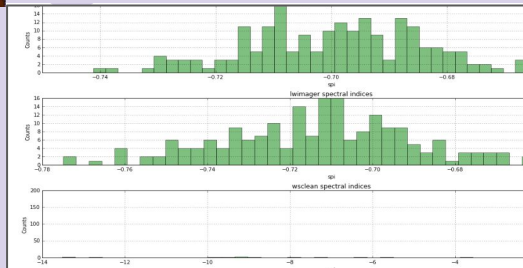
**Athanaseus Ramalia (RU MSc, 2019))**

Quantifying imaging performance of legacy and novel Imaging software packages



**Alessia Verz (INAF, PhD, 2018)**

SKA strong gravitational lensing simulations



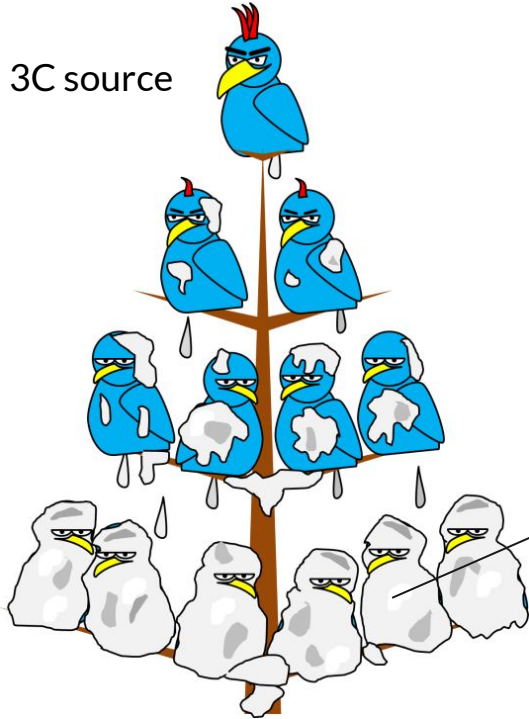
**Kelachukwu Iheanetu(RU, PhD, 2020)**

Effects of the Primary Beam on image fidelity

# Humbled by 3C283

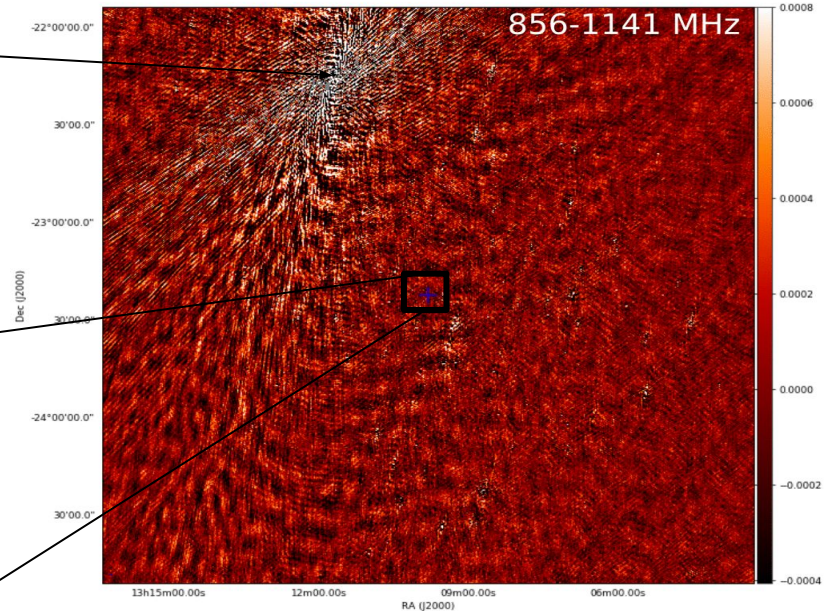
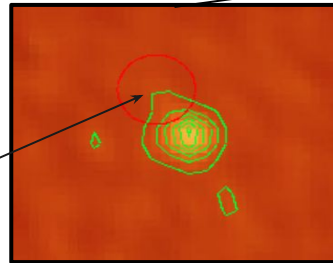


3C source

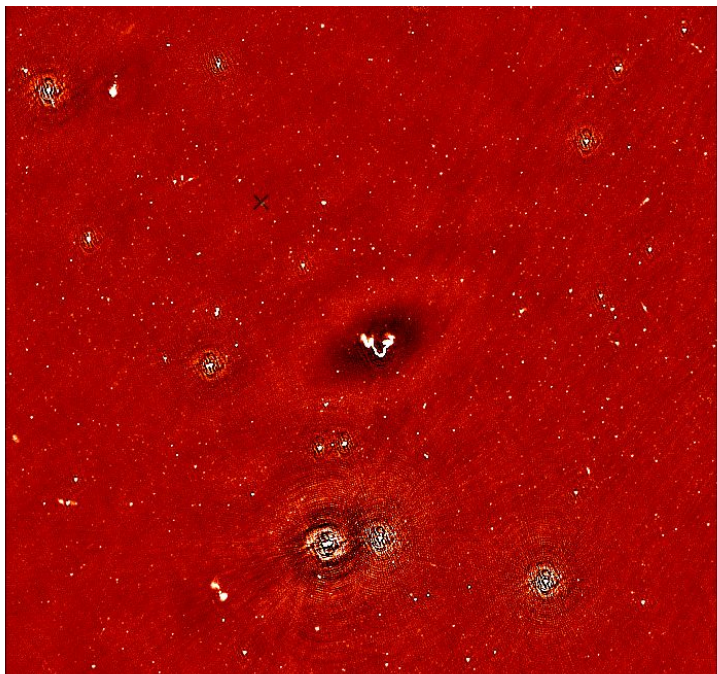


3C283  
5.2 Jy @ 1.4 GHz

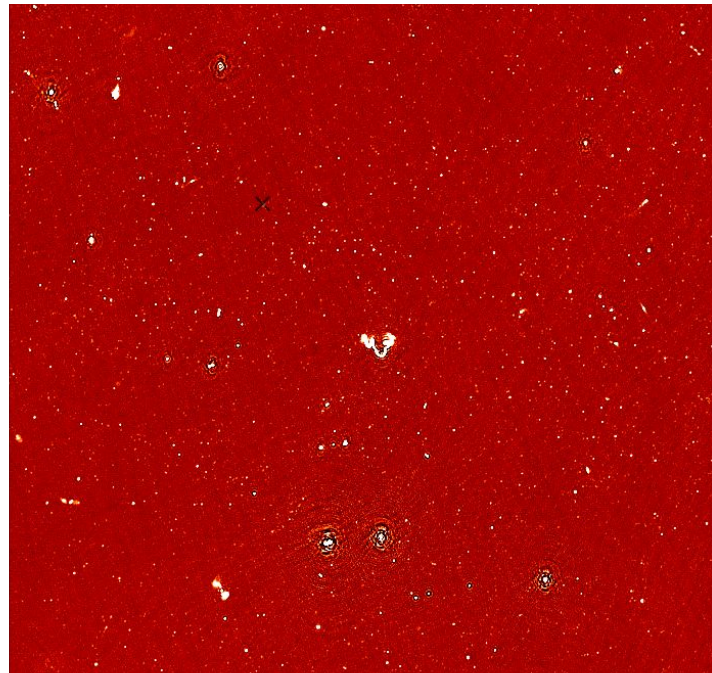
Very bright source that  
falls into null of PB as a  
function of frequency!!



## Flexible (write own workers)



Implemented in  
Cubical  
(Kenyon et al 2019)



$$\mathbf{V}_{pq} = \mathbf{G}_p \left( \mathbf{dE}_p \mathbf{E}_p \mathbf{X}_{pq}^{(1)} \mathbf{E}_q^H \mathbf{dE}_q^H + \mathbf{X}_{pq}^{(2)} + \dots \right) \mathbf{G}_q^H$$

# GW170817 afterglow

THE ASTROPHYSICAL JOURNAL LETTERS, 848:L12 (59pp), 2017 October 20 <https://doi.org/10.3847/2041-8213/aa91e9>

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**OPEN ACCESS**

**Multi-messenger Observations of a Binary Neutron Star Merger\***

LIGO Scientific Collaboration and Virgo Collaboration, Fermi GBM, INTEGRAL, IceCube Collaboration, AstroSat Cadmium Zinc Telluride Imager Team, IPN Collaboration, The Insight-HXMT Collaboration, ANTARES Collaboration, The Swift Collaboration, AGILE Team, The 1M2H Team, The Dark Energy Camera GW-EM Collaboration and the DES Collaboration, The DLT40 Collaboration, GRAWITA: GRAvitational Wave Inaf TeAm, The Fermi Large Area Telescope Collaboration, ATCA: Australia Telescope Compact Array, ASKAP: Australian SKA Pathfinder, Las Cumbres Observatory Group, OzGrav, DWF (Deeper, Wider, Faster Program), AST3, and CAASTRO Collaborations, The VINROUGE Collaboration, MASTER Collaboration, J-GEM, GROWTH, JAGWAR, Caltech-NRAO, TTU-NRAO, and NuSTAR Collaborations, Pan-STARRS, The MAXI Team, TZAC Consortium, KU Collaboration, Nordic Optical Telescope, ePESSTO, GROND, Texas Tech University, SALT Group, TOROS: Transient Robotic Observatory of the South Collaboration, The BOOTES Collaboration, MWA: Murchison Widefield Array, The CALET Collaboration, IKI-GW Follow-up Collaboration, H.E.S.S. Collaboration, LOFAR Collaboration, LWA: Long Wavelength Array, HAWC Collaboration, The Pierre Auger Collaboration, ALMA Collaboration, Euro VLBI Team, Pi of the Sky Collaboration, The Chandra Team at McGill University, DFN: Desert Fireball Network, ATLAS, High Time Resolution Universe Survey, RMAS and RATIR, and SKA South Africa/MeerKAT

THE ASTROPHYSICAL JOURNAL LETTERS, 868:L11 (8pp), 2018 November 20 <https://doi.org/10.3847/2041-8213/aacda7>

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**A Strong Jet Signature in the Late-time Light Curve of GW170817**

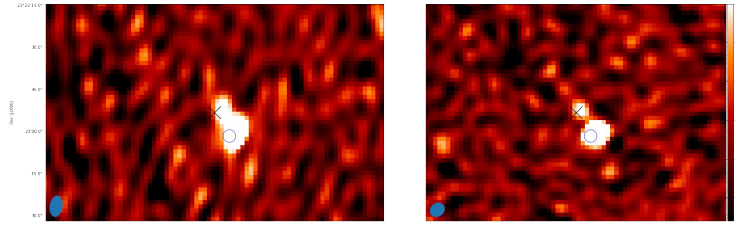
K. P. Mooley<sup>1,2,14</sup>, D. A. Fraill<sup>1</sup>, D. Dobie<sup>3,4</sup>, E. Lenc<sup>4</sup>, A. Corsi<sup>5</sup>, K. De<sup>2</sup>, A. J. Nayana<sup>6</sup>, S. Makhathini<sup>7,8</sup>, I. Heywood<sup>8,9</sup>, T. Murphy<sup>3</sup>, D. L. Kaplan<sup>10</sup>, P. Chandra<sup>6</sup>, O. Smirnov<sup>7,8</sup>, E. Nakar<sup>11</sup>, G. Hallinan<sup>7</sup>, F. Camilo<sup>6</sup>, R. Fender<sup>9,12</sup>, S. Goethart<sup>1</sup>, P. Groot<sup>12,13</sup>, M. M. Kasliwal<sup>2</sup>, S. R. Kulkarni<sup>2</sup>, and P. A. Woudt<sup>12</sup>

<sup>1</sup>National Radio Astronomy Observatory, Socorro, NM 87801, USA; [kamal@astro.caltech.edu](mailto:kamal@astro.caltech.edu)  
<sup>2</sup>Caltech, 1200 E. California Blvd. MC 249-17, Pasadena, CA 91125, USA  
<sup>3</sup>Sydney Institute for Astronomy, School of Physics, University of Sydney, Sydney, New South Wales 2006, Australia

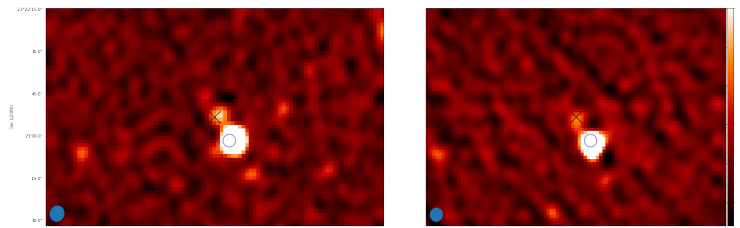
**The Panchromatic Afterglow of GW170817: The Full Uniform Data Set, Modeling, Comparison with Previous Results, and Implications**

Makhathini, S.; Mooley, K. P.; Brightman, M.; Hotokezaka, K.; Nayana, A. J.; Intema, H. T.; Dobie, D.; Lenc, E.; Perley, D. A.; Fremling, C.; Moldón, J.; Lazzati, D.; Kaplan, D. L.; Balasubramanian, A.; Brown, I. S.; Carbone, D.; Chandra, P.; Corsi, A.; Camilo, F.; Deller, A.; Fraill, D. A.; Murphy, T.; Murphy, E. J.; Nakar, E.; Smirnov, O.; Beswick, R. J.; Fender, R.; Hallinan, G.; Heywood, I.; Kasliwal, M.; Lee, B.; Lu, W.; Rana, J.; Perkins, S.; White, S. V.; Józsa, G. I. G.; Hugo, B.; Kamphuis, P.

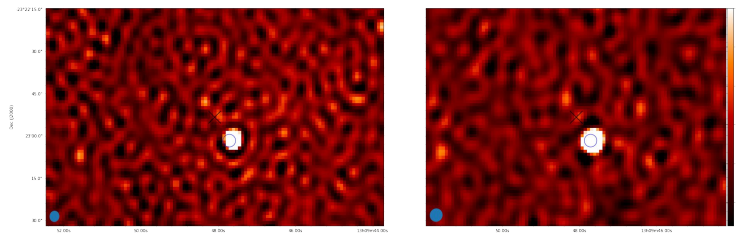
## MeerKAT detections



Jan 19, 02 March 2018



26 April, 05 May 2018

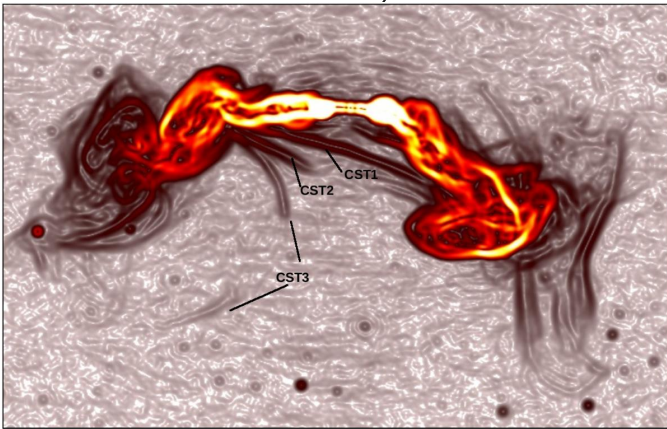
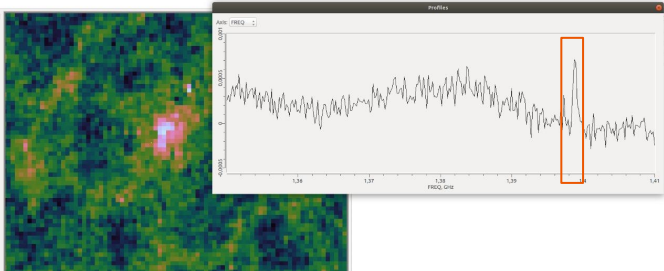
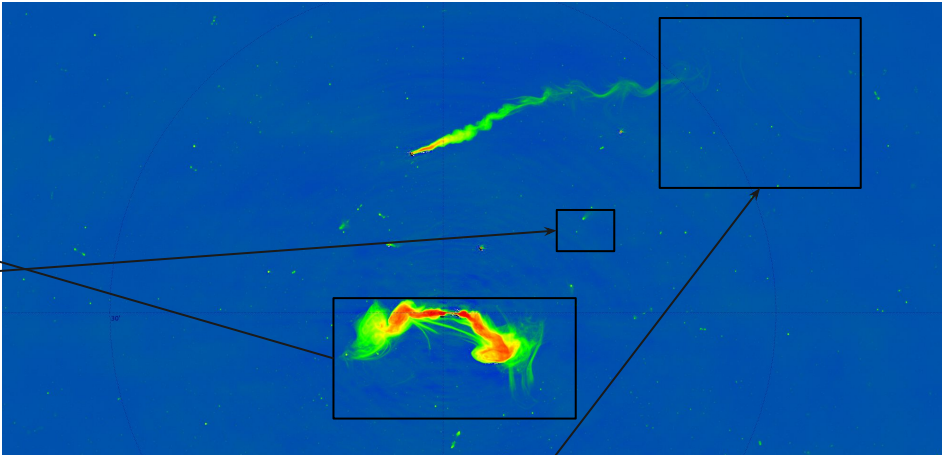


07 July, 01 Sept 2018

# CTN discovery

Collimated synchrotron threads linking the radio lobes of ESO 137-006 (Ramatsoku+ 2020)

Intended science target



**Thank you.**

