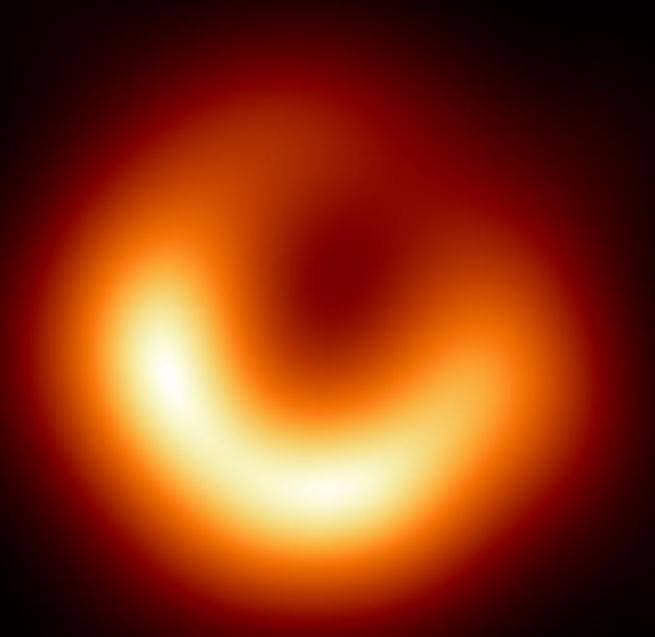


Photographing a Black Hole with the Event Horizon Telescope

Andrew Chael

NHFP Fellow
Princeton University

July 10, 2020



PRINCETON
UNIVERSITY



Event Horizon Telescope

The EHT Collaboration



The EHT:

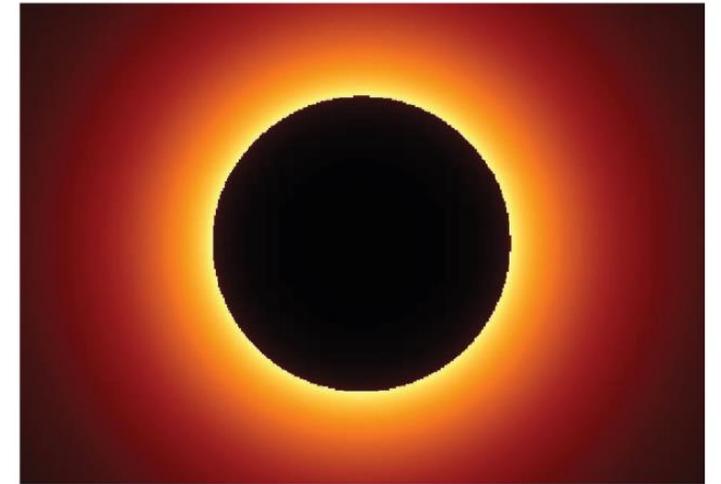
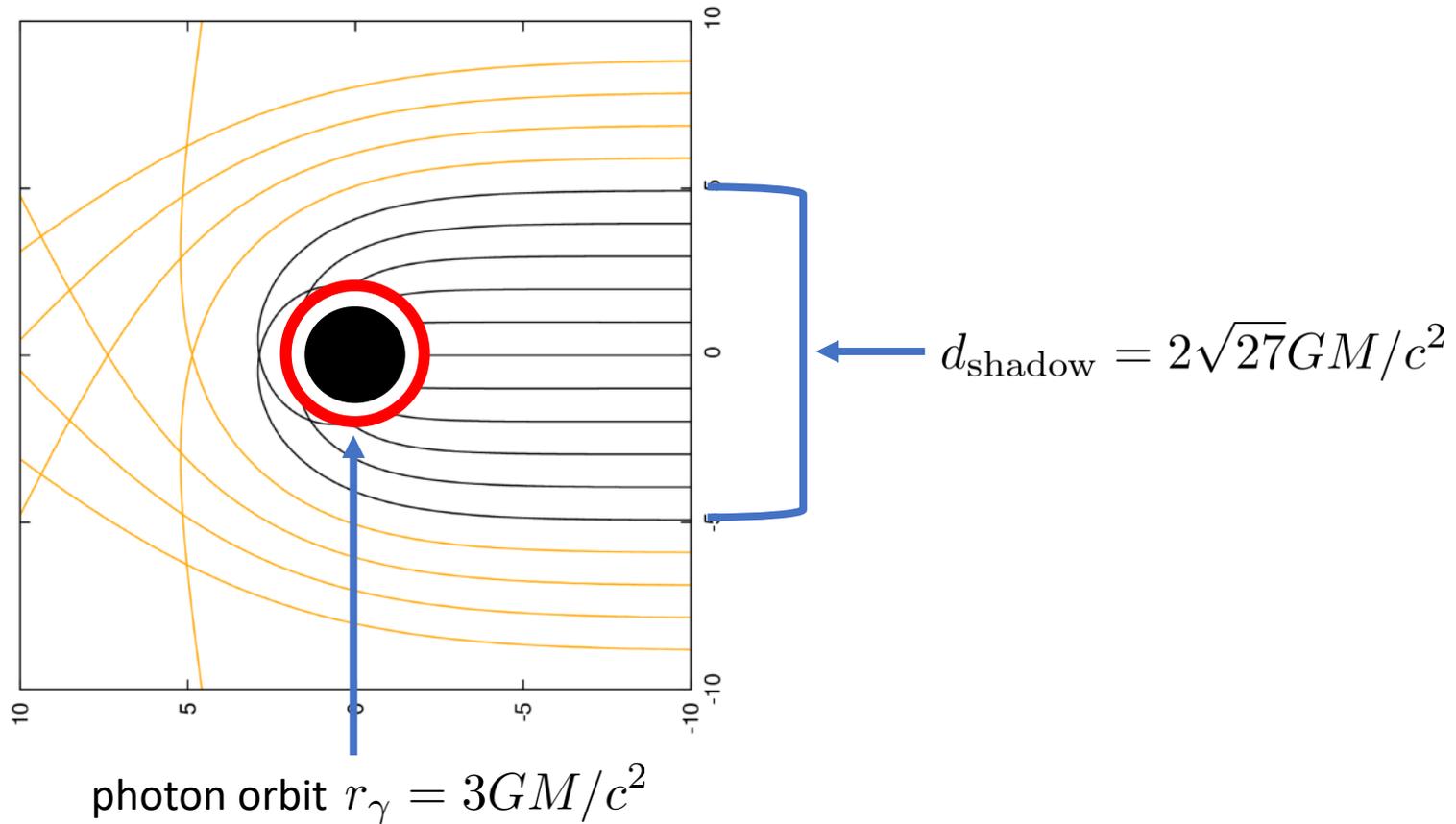
Many antennas, lots of software, one
computational telescope

Result papers: EHTC+ 2019 papers 1-6: https://iopscience.iop.org/journal/2041-8205/page/Focus_on_EHT

Story on software behind many steps of the EHT process: <https://www.welcometothejungle.com/en/articles/btc-black-hole-imaging-software-telescope>

What does a black hole look like?

The Black Hole Shadow



Accretion Energy: black holes can shine brightly

Accretion power per unit mass:

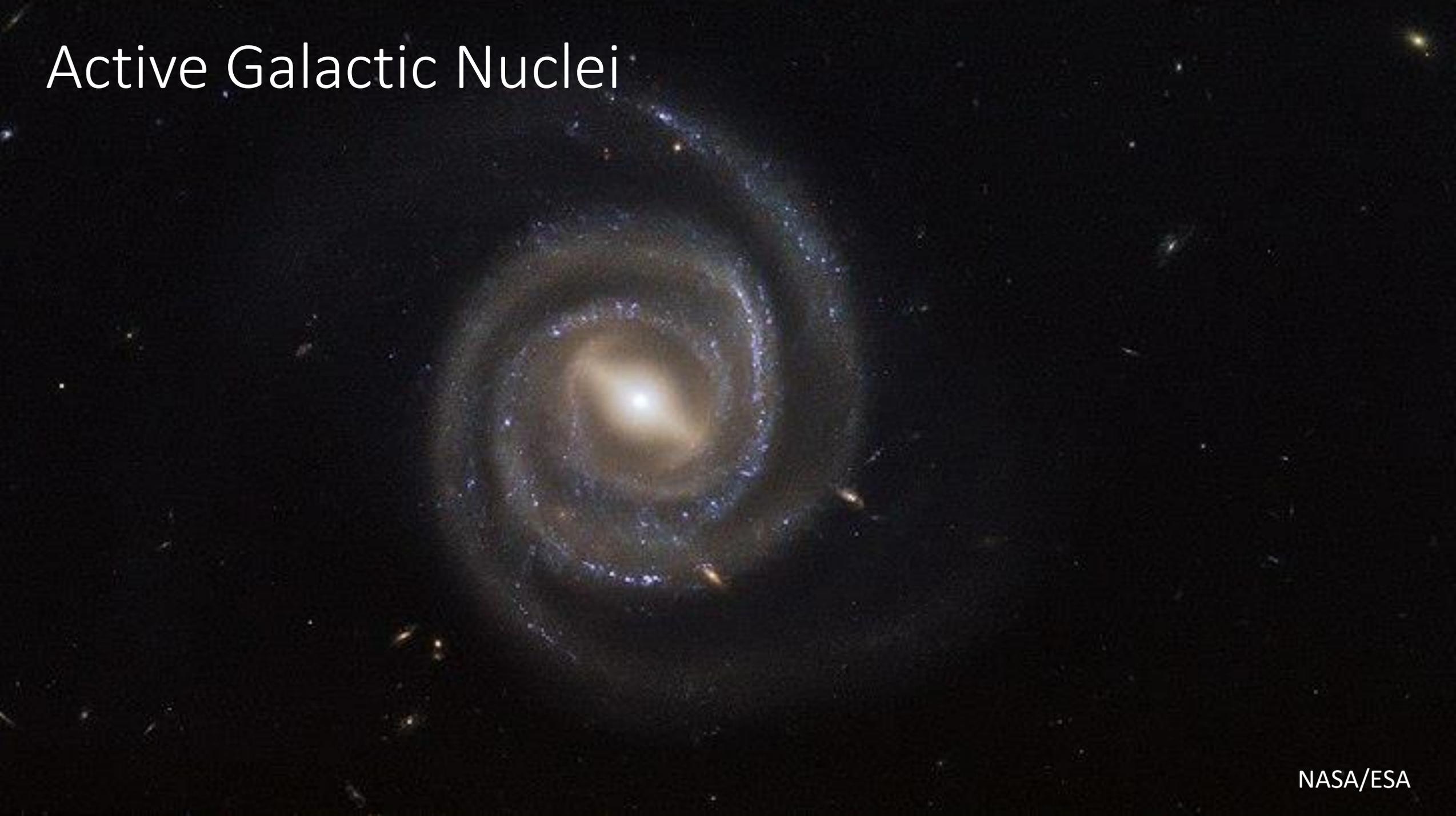
$$\begin{aligned}\Delta E/mc^2 &= GM/Rc^2 \\ &= 1/2 \text{ at } R = R_{\text{Sch}}\end{aligned}$$

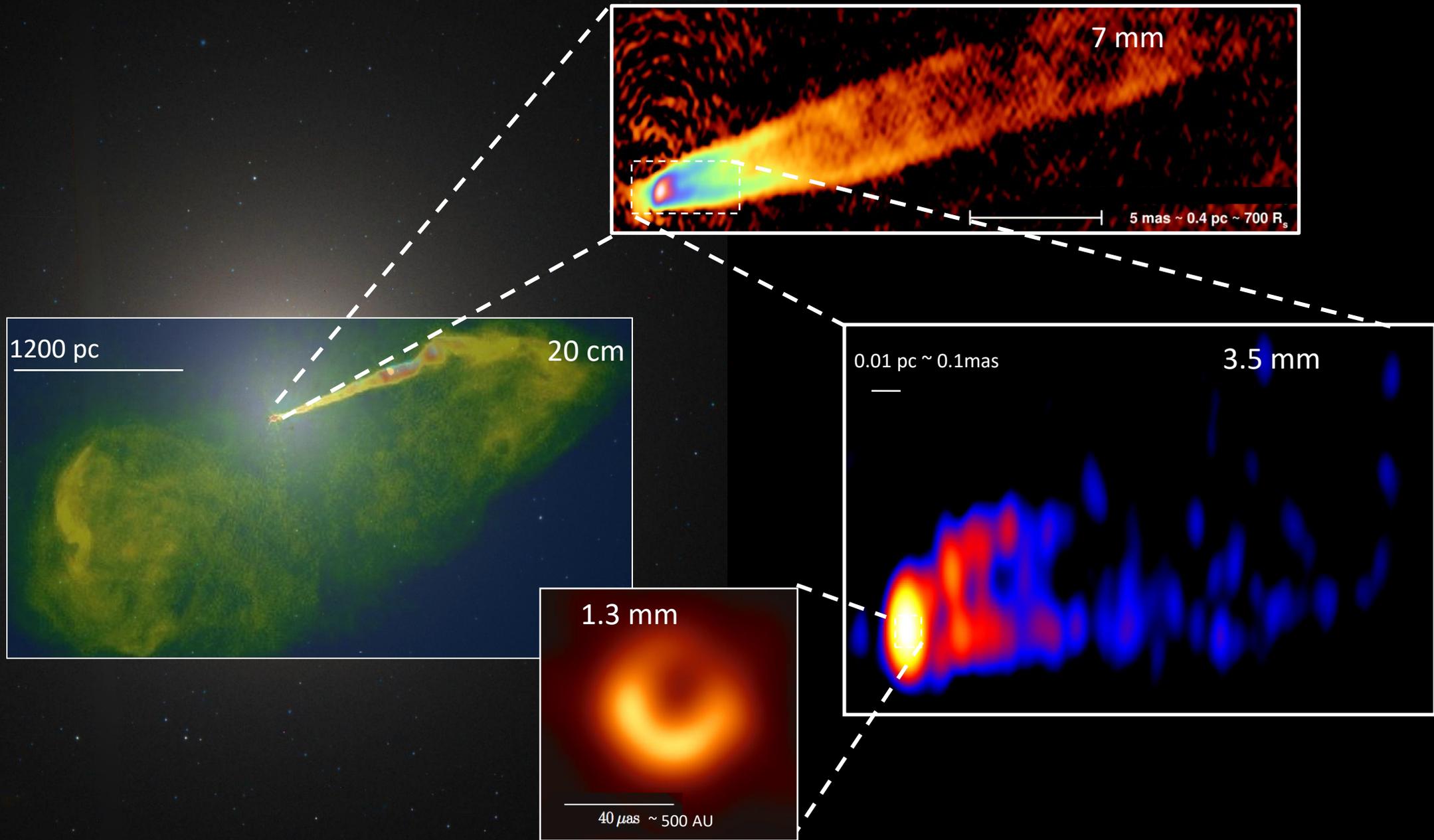
For nuclear fusion:

$$\Delta E/mc^2 = 0.007$$



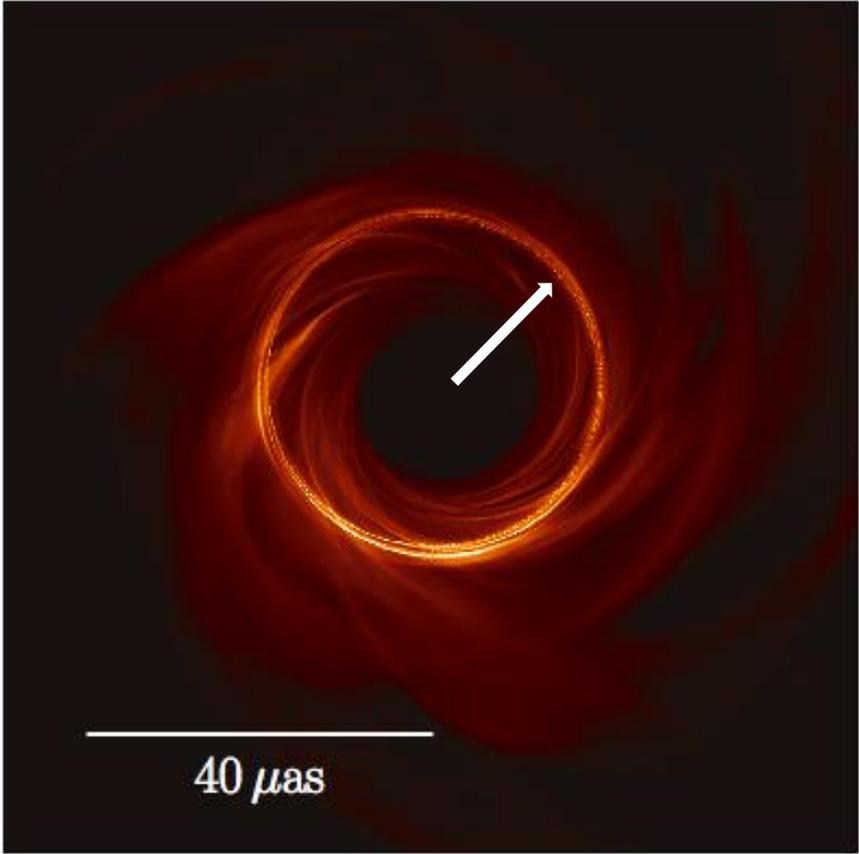
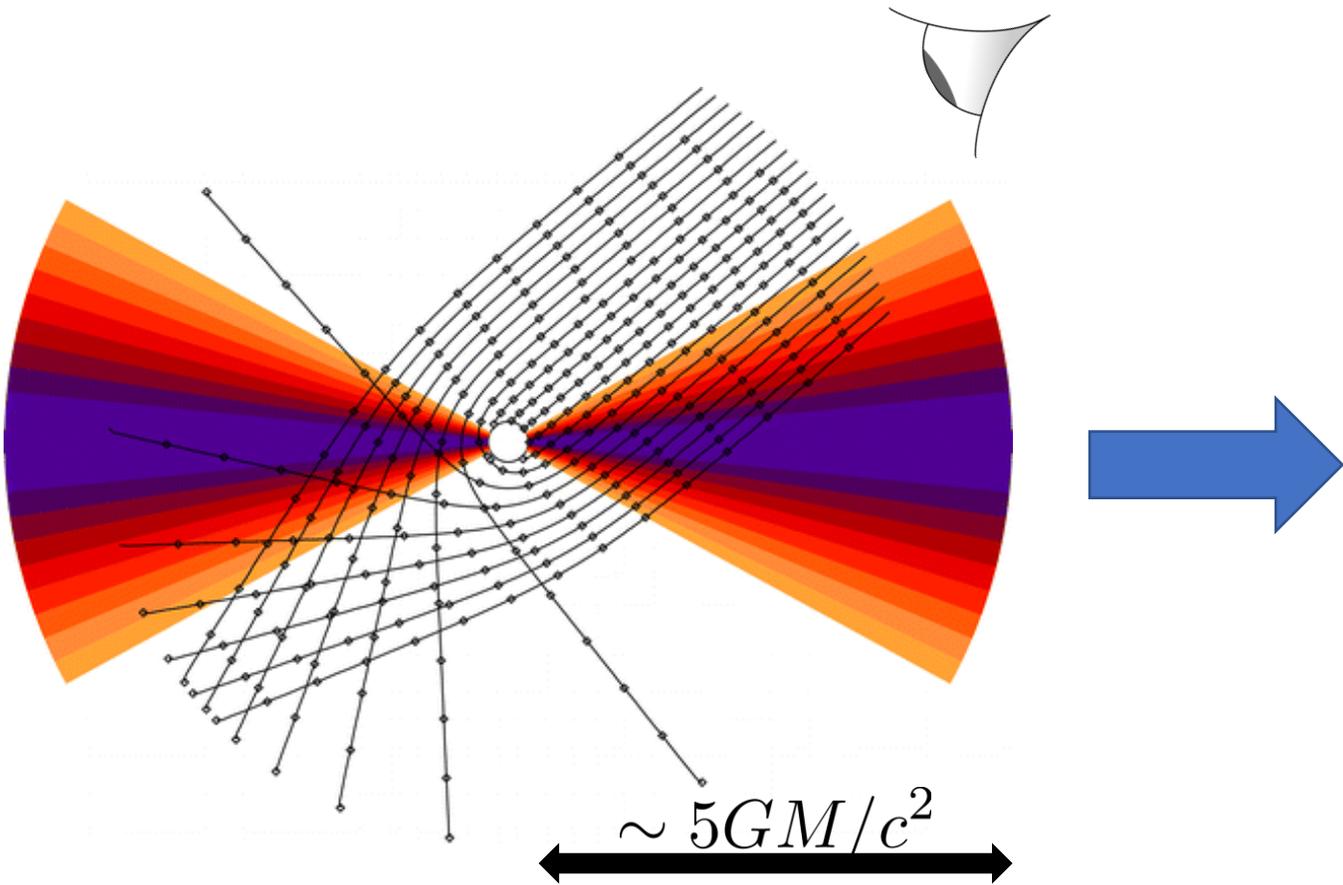
Active Galactic Nuclei





The Black Hole Shadow: Modern Simulations

$$r_{\text{shadow}} = \sqrt{27}GM/c^2$$



How big is the shadow?

M87 is supermassive, so its shadow is big:

$$d_{\text{shadow}} \approx 650 \text{ AU}$$

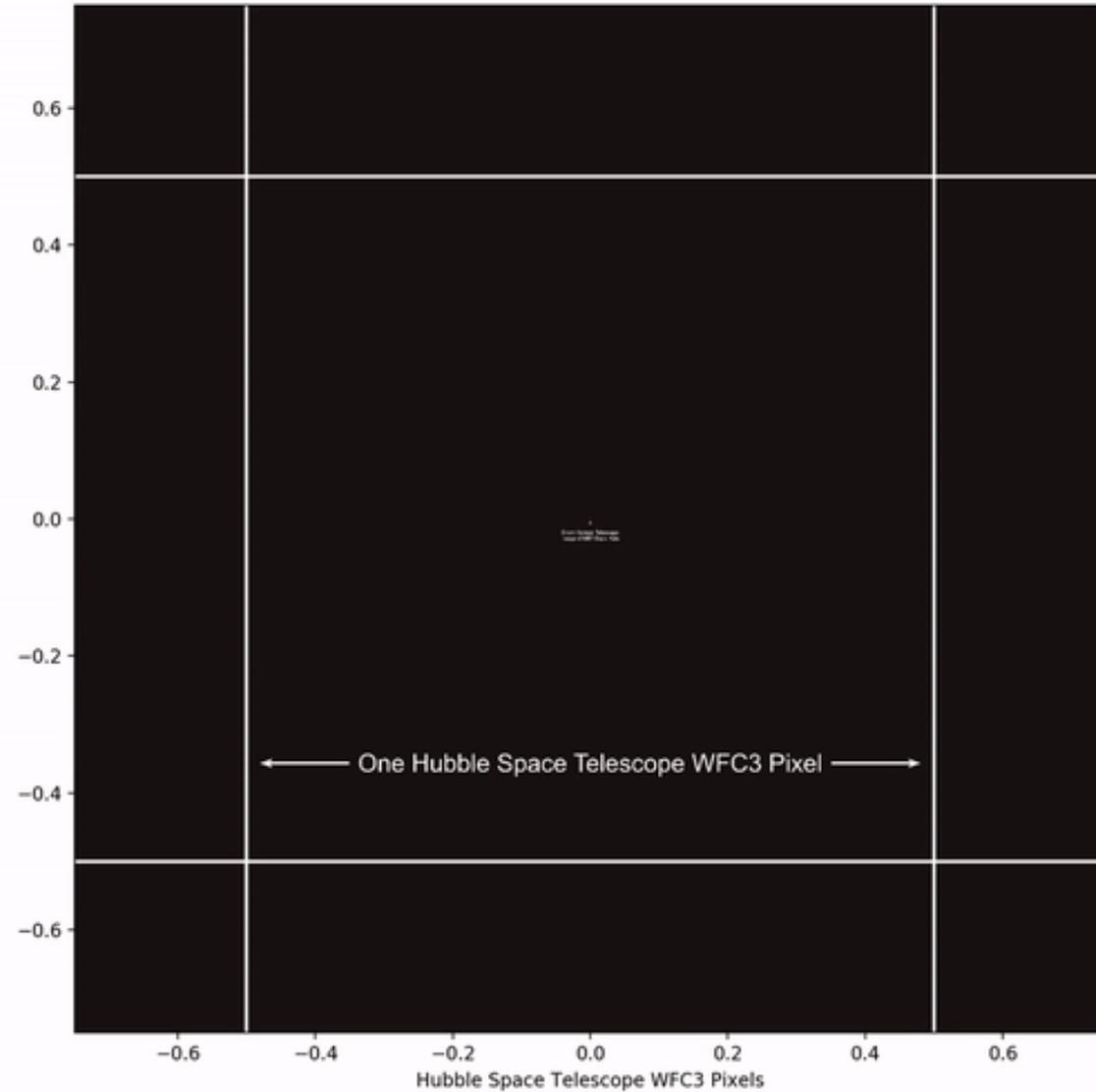
Unfortunately, M87 is really far away.....

$$D_{\text{M87}} \approx 50 \text{ million ly}$$

To us, M87's shadow is really, really, really small

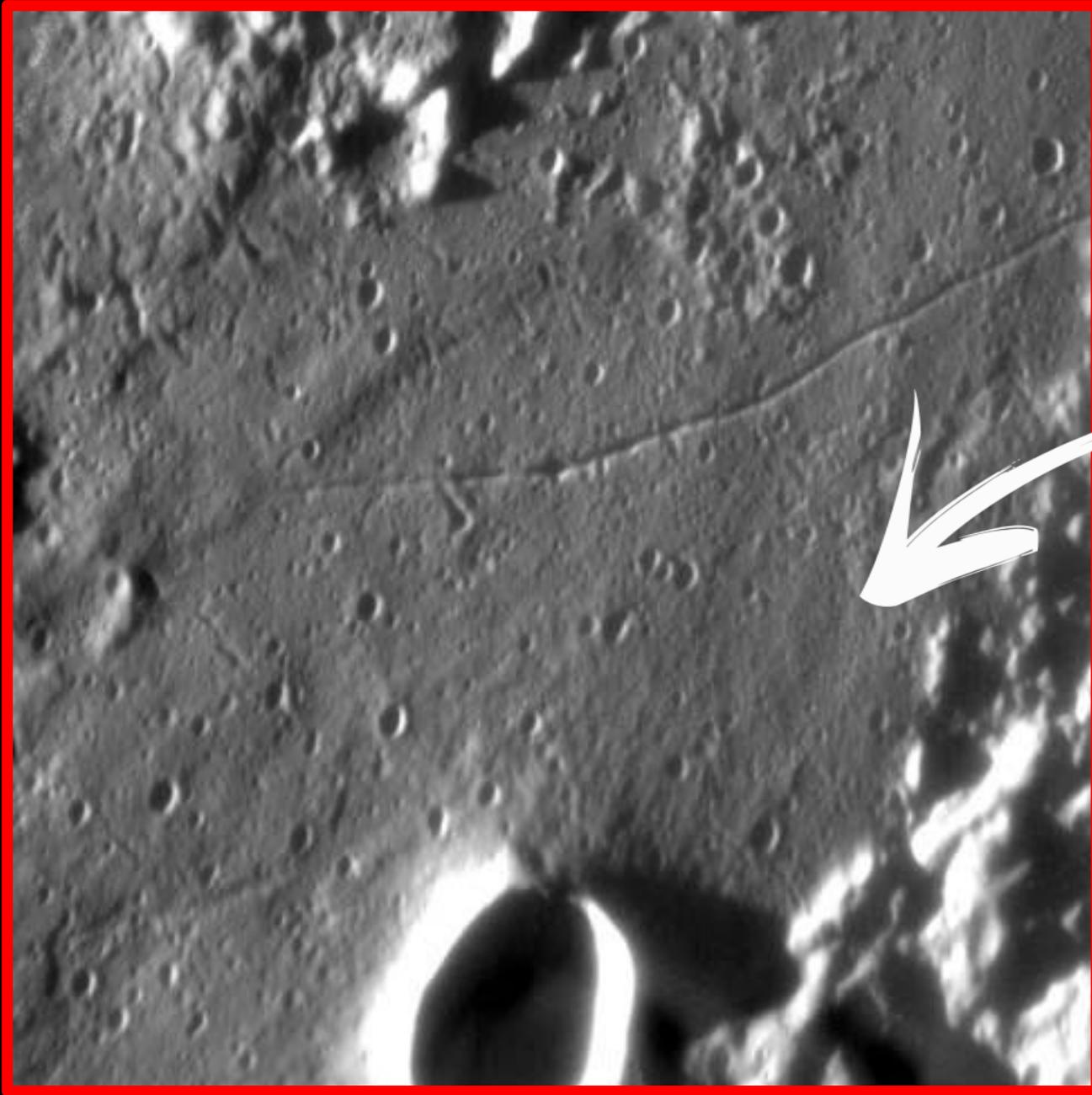
$$\frac{d_{\text{shadow}}}{D_{\text{M87}}} \approx 40 \mu\text{as} \approx 10^{-8} \text{ deg}$$

How small is 40 microarcseconds?

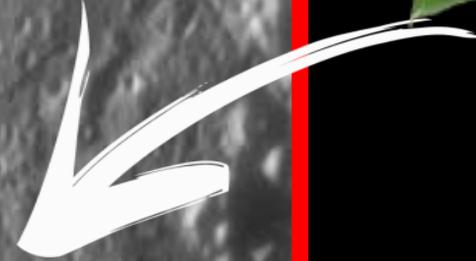


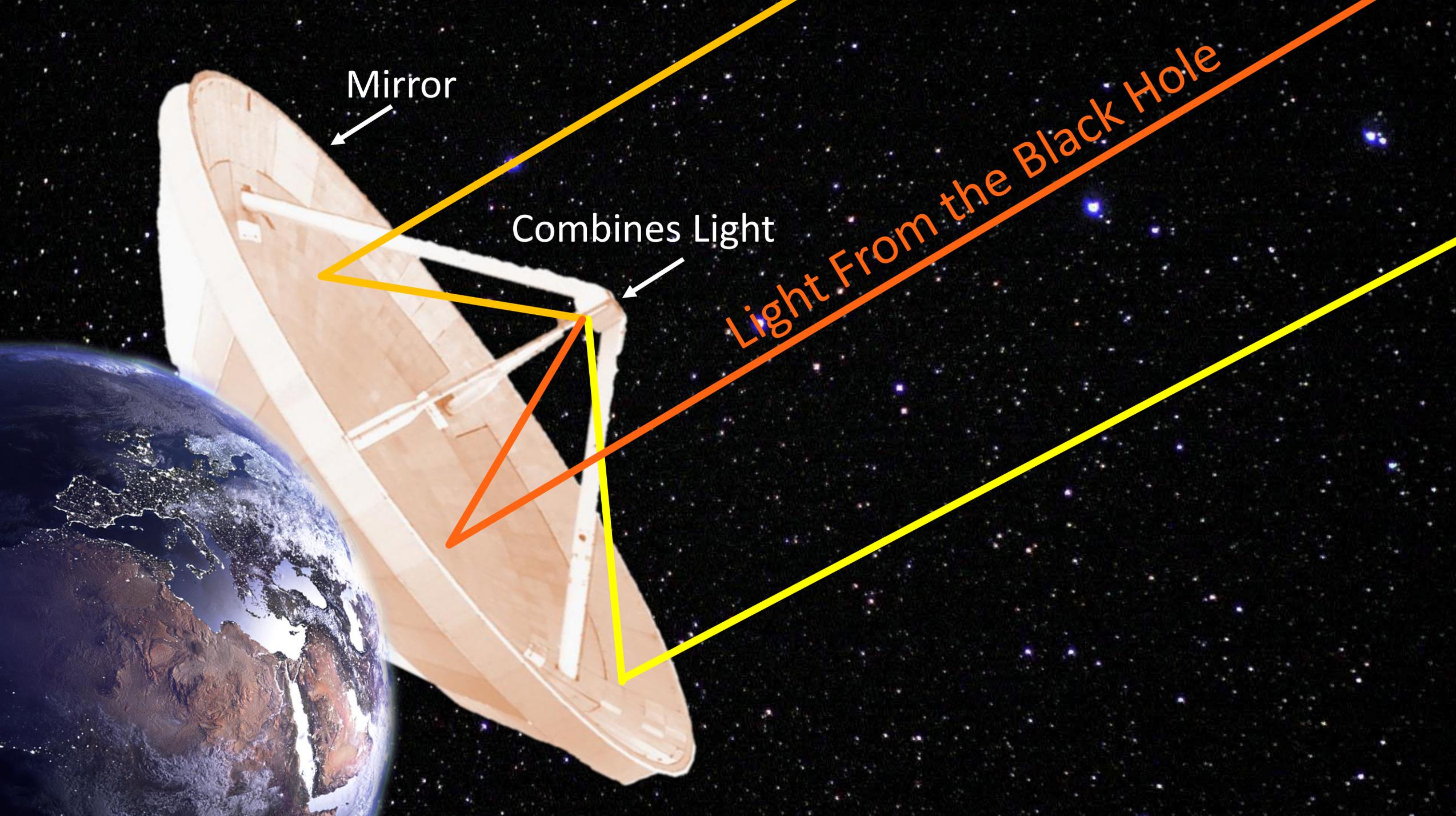


Black Hole
Orange on
Shadow



Each Pixel is
1.5 Million
's

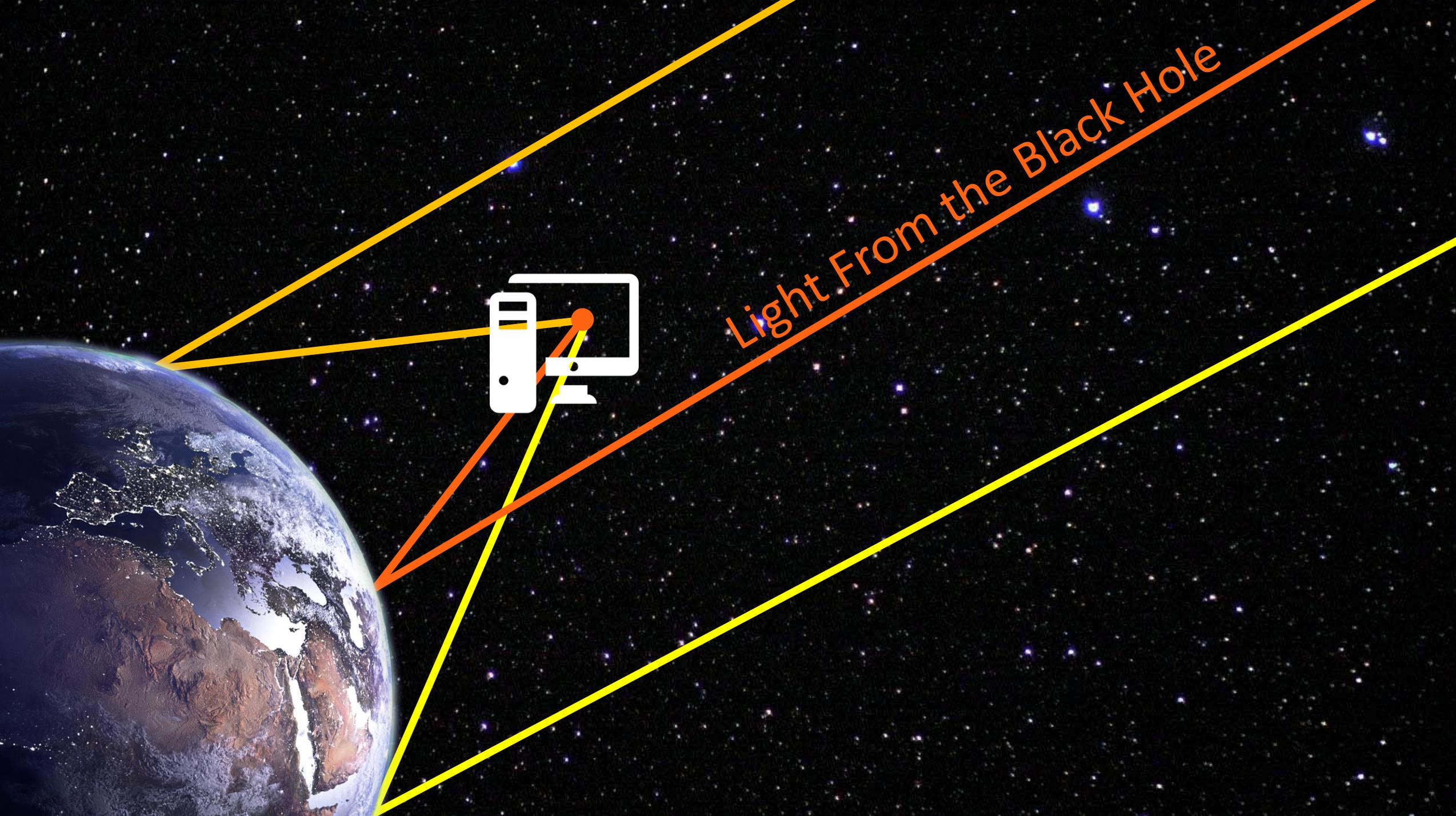




Mirror

Combines Light

Light From the Black Hole



Light From the Black Hole

The EHT:
Many antennas, one **computational**
telescope

The Physical EHT

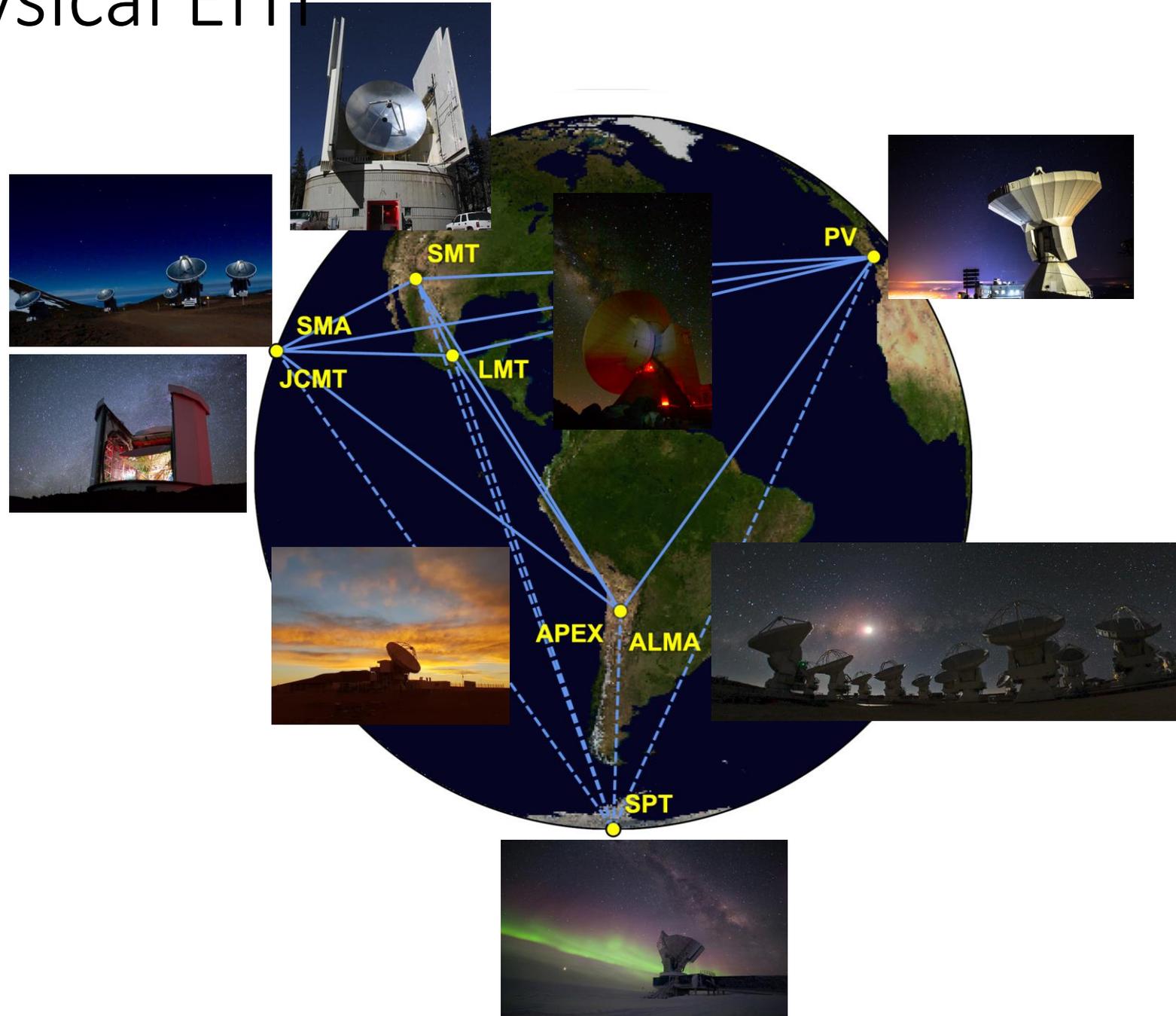


Photo Credits: EHT Collaboration 2019 (Paper III)
ALMA, Sven Dornbusch, Junhan Kim, Helge Rottmann,
David Sanchez, Daniel Michalik, Jonathan Weintraub,
William Montgomerie, Tom Folkers, ESO, IRAM

The Computational EHT:

NumPy 



scikit-image
image processing in python



GitHub



h5py 2.10.0

 **pandas**



jupyter

seaborn 0.10.1

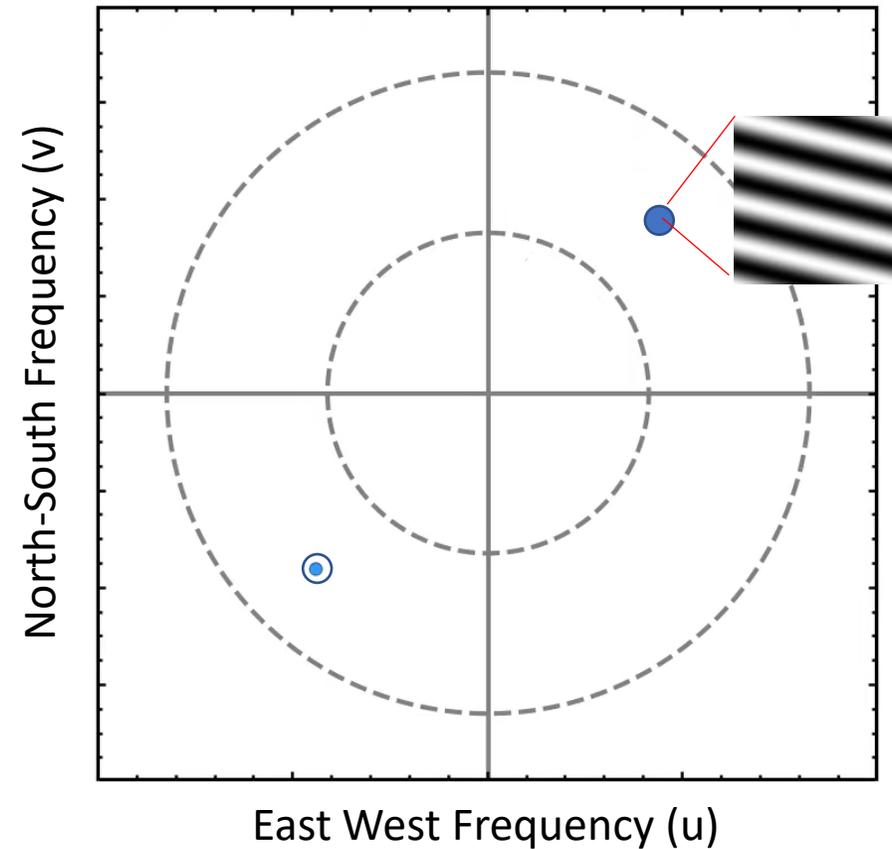


matplotlib
Version 3.2.2

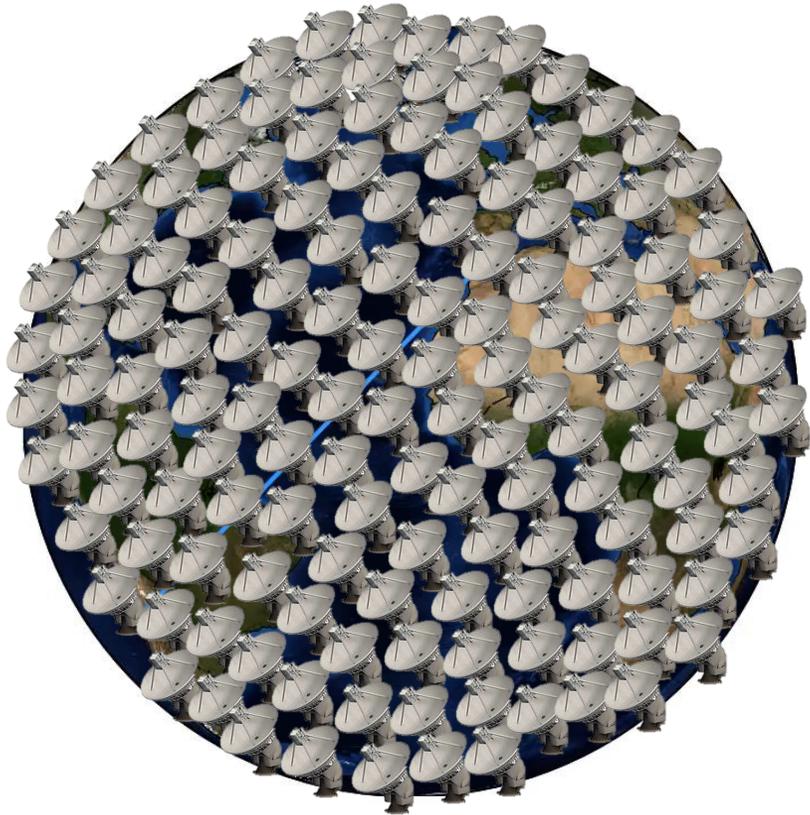
... and many, many more

Very Long Baseline Interferometry (VLBI)

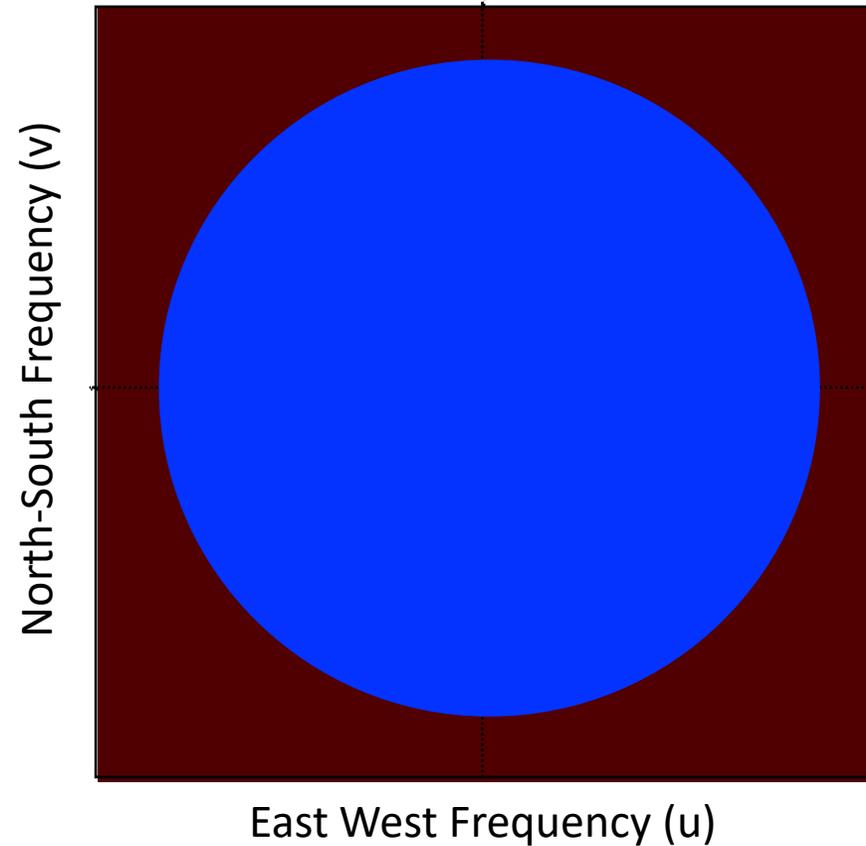
Fourier Domain Measurements



Very Long Baseline Interferometry (VLBI)



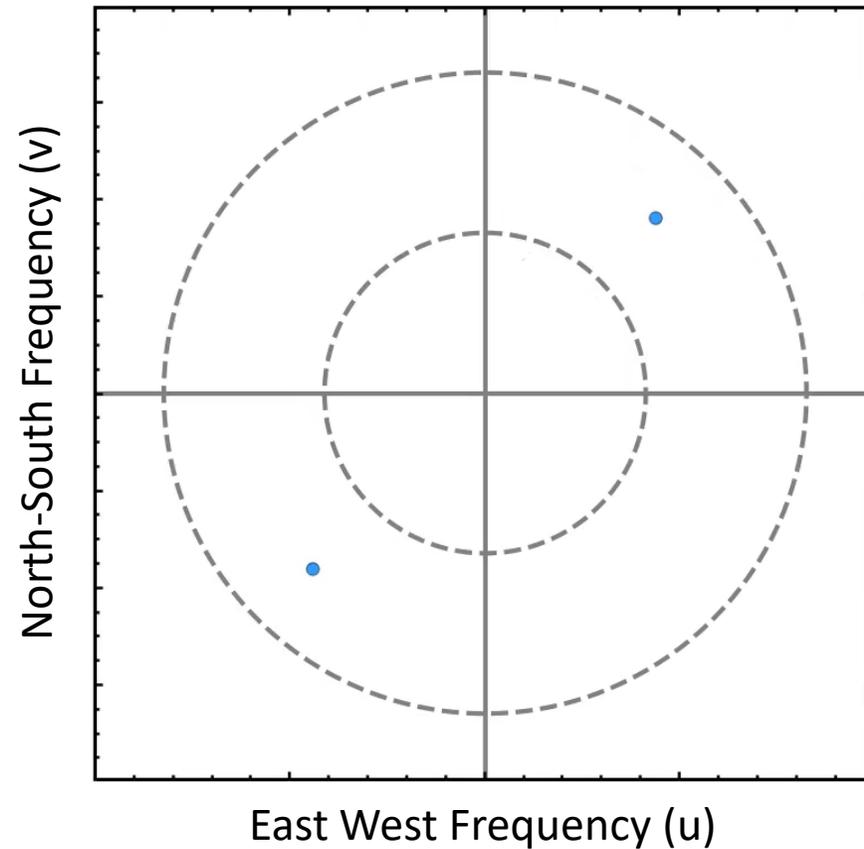
Fourier Domain Measurements



Earth's Rotation gives us more measurements



Fourier Domain Measurements



EHT 2017 Observations

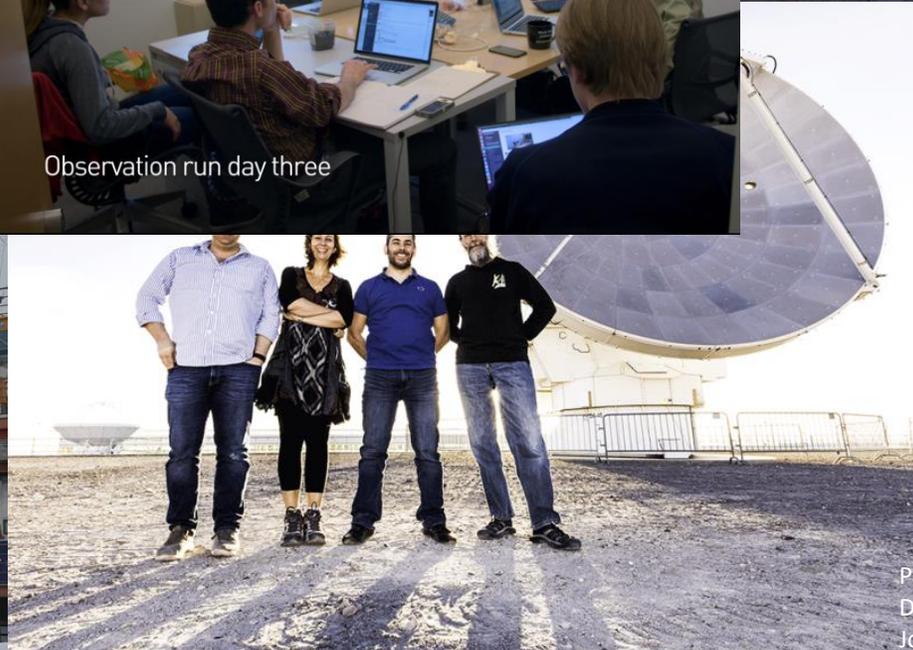
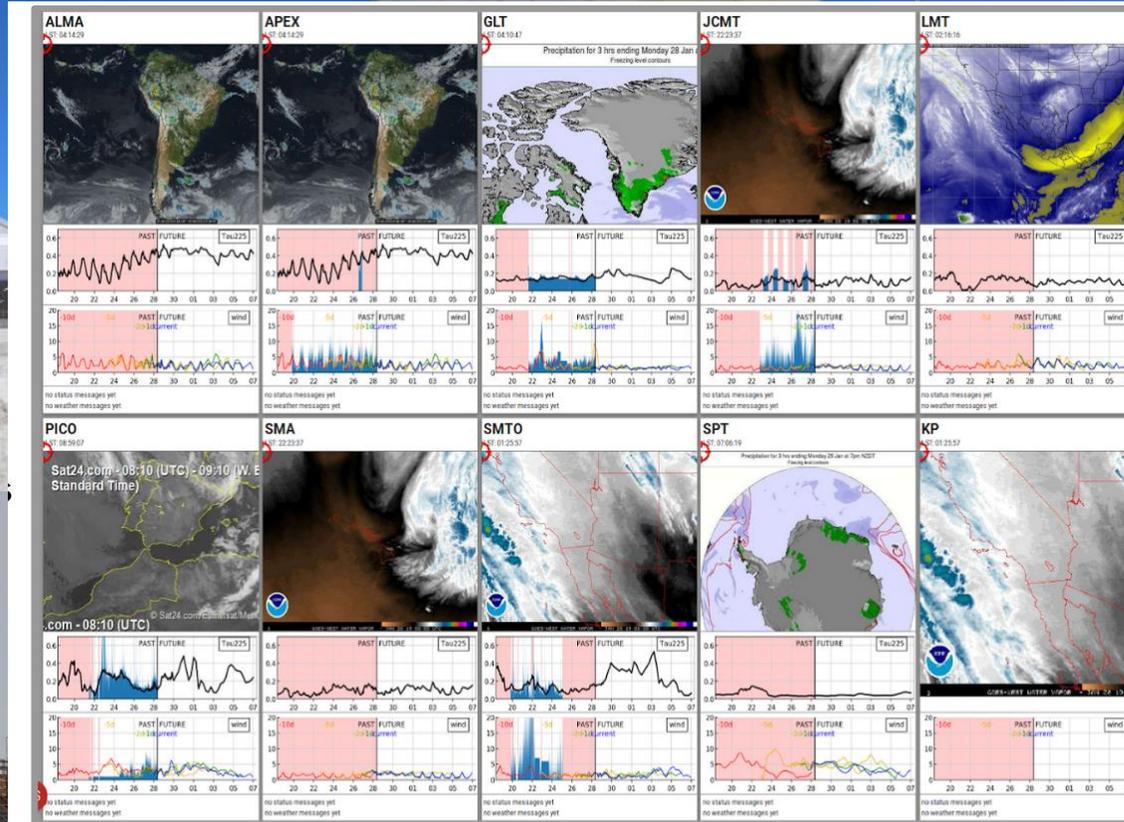


Photo credits:
David Michalik, Junhan Kim, Salvaor Sanchez, Heige Rottman,
Jonathan Weintroub, Gopal Narayanan

EHT 2017 Observations

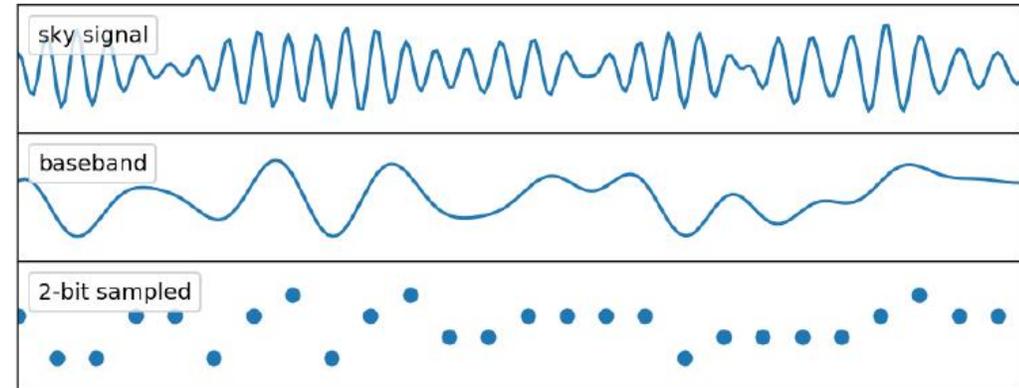
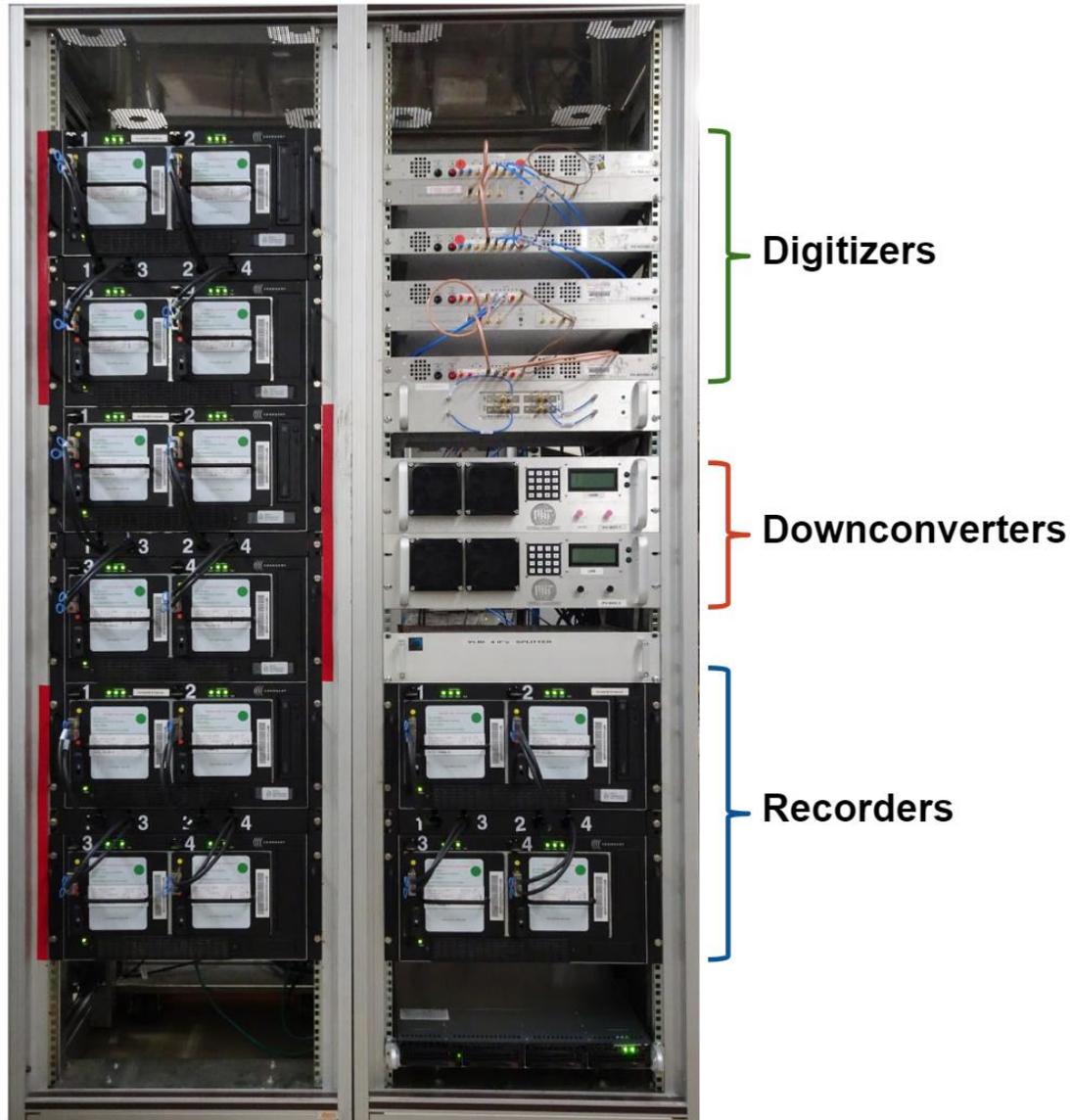


The VLBI monitor helps us track current and forecasted weather, and telescope operations
<https://vlbimon1.science.ru.nl/login.html>

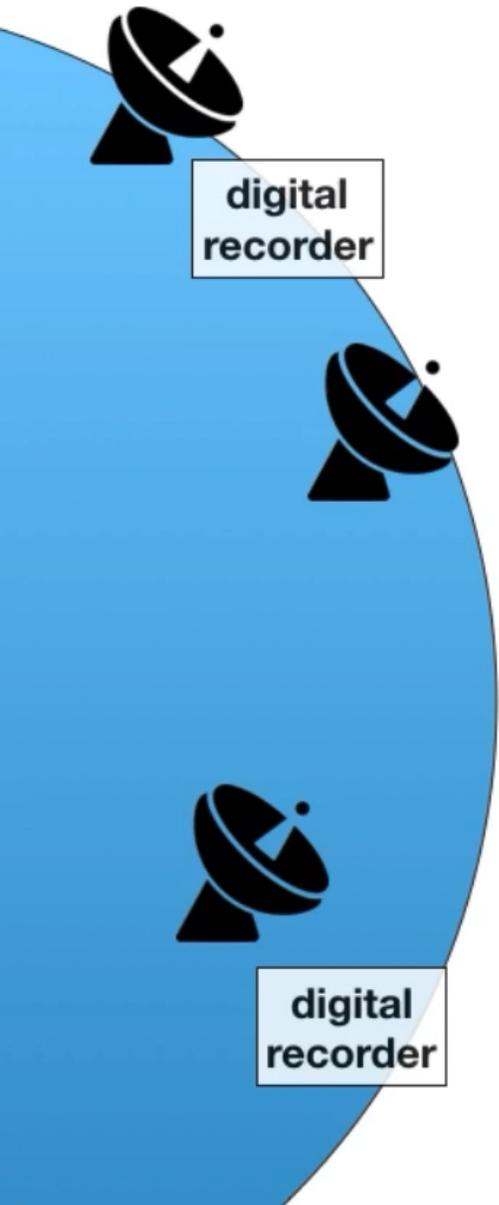


Photo credits:
David Michalik, Junhan Kim, Salvaor Sanchez, Heige Rottman
Jonathan Weintroub, Gopal Narayanan

EHT Instrumentation – records data at 8 Gb/sec

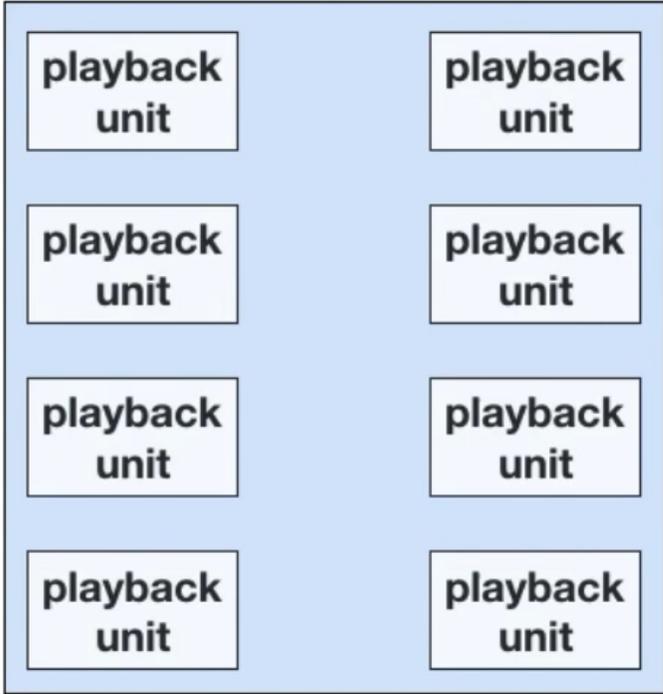


The EHT data pipeline

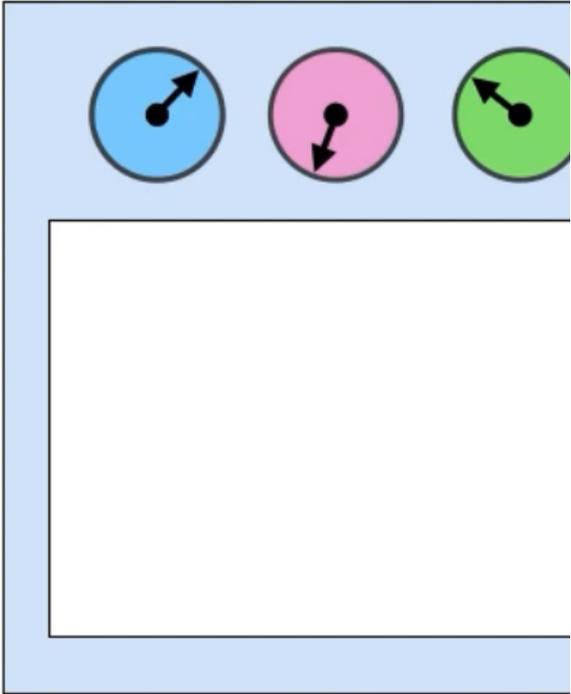


digital recorder

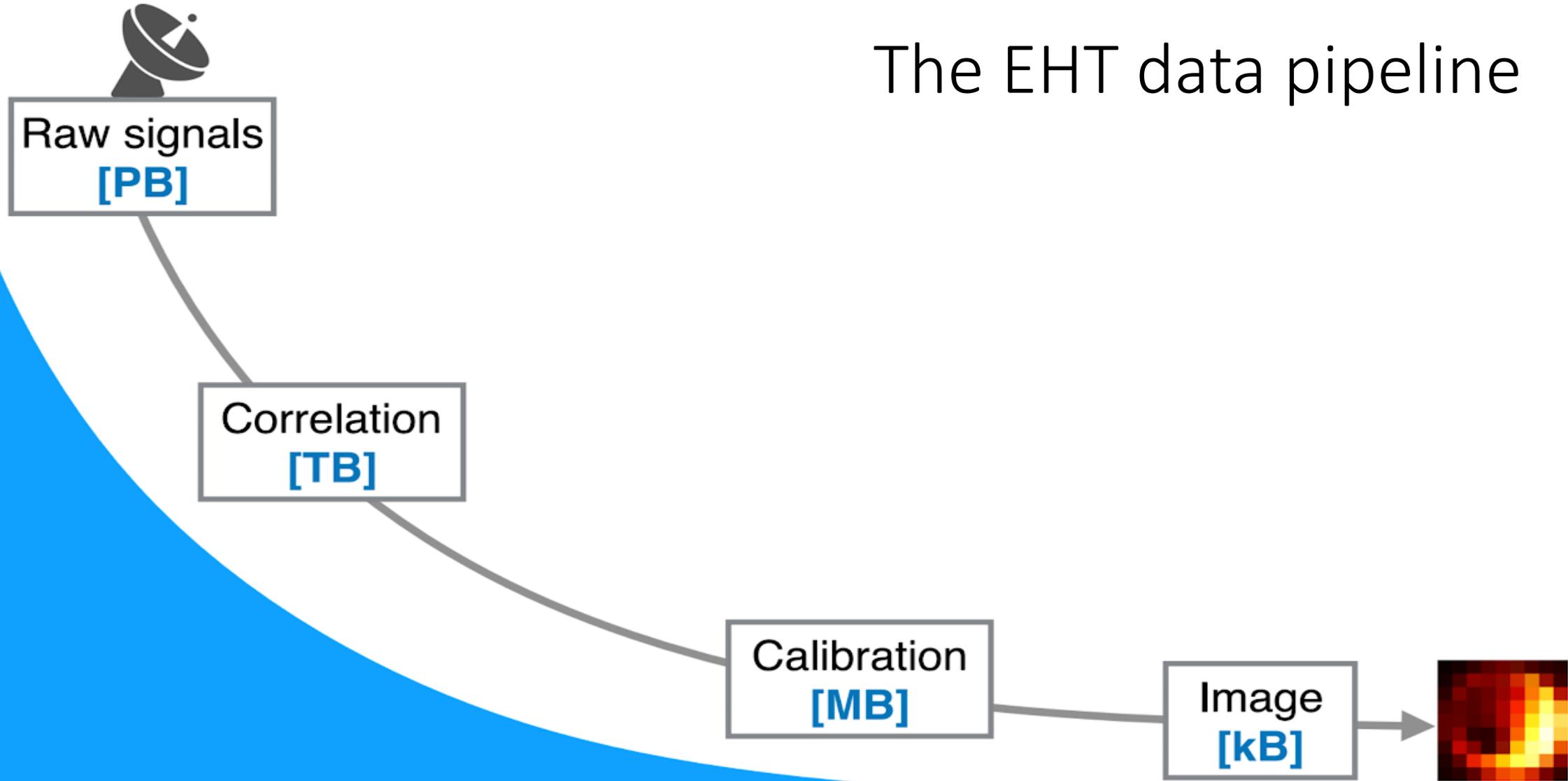
EHT correlator



Calibration

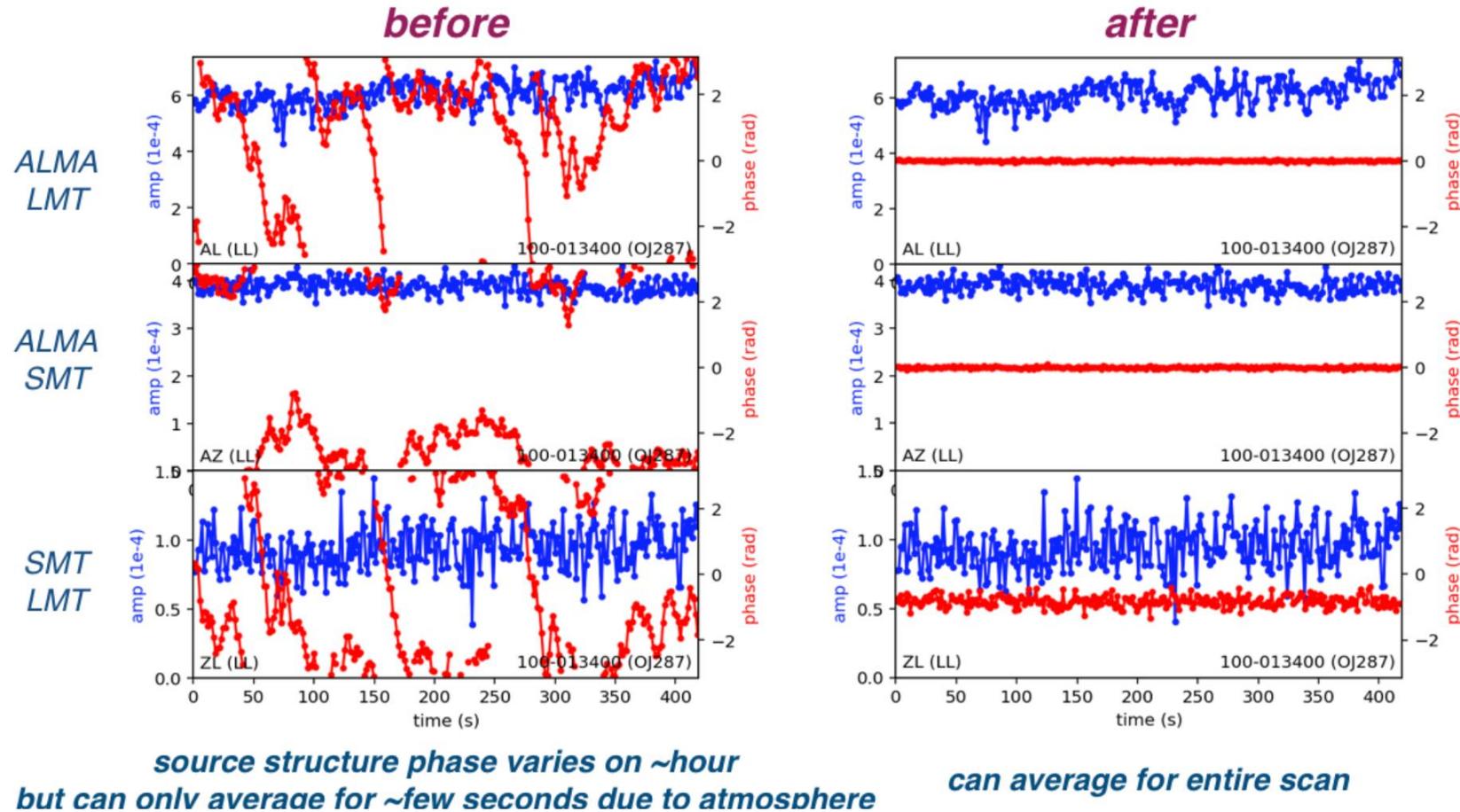


The EHT data pipeline



12 orders of magnitude in data reduction

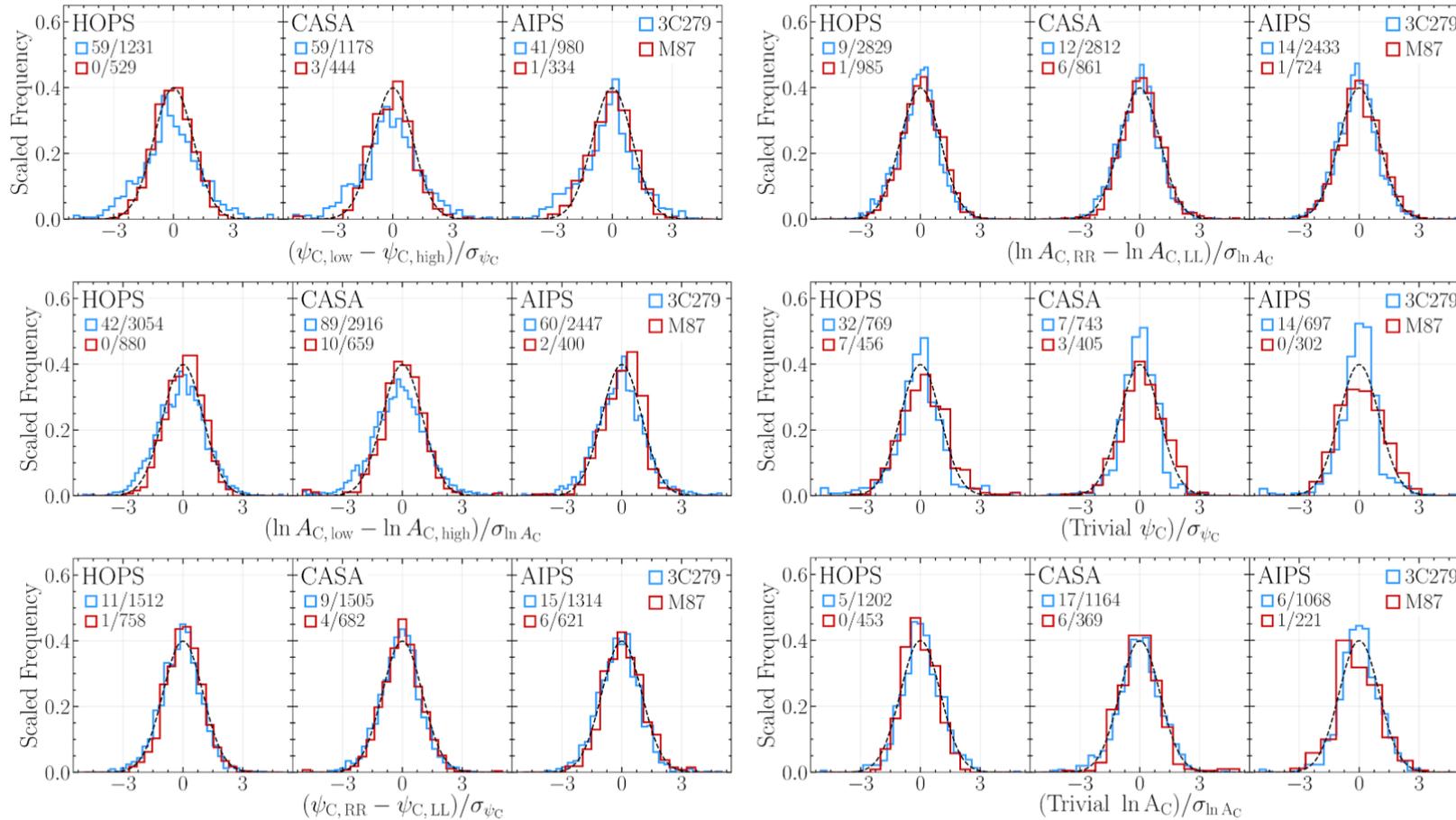
Data Calibration: correcting for atmospheric turbulence



Combination of specialized/old C code for VLBI:
with new python interfaces and plotting: <https://github.com/sao-eh/eat>

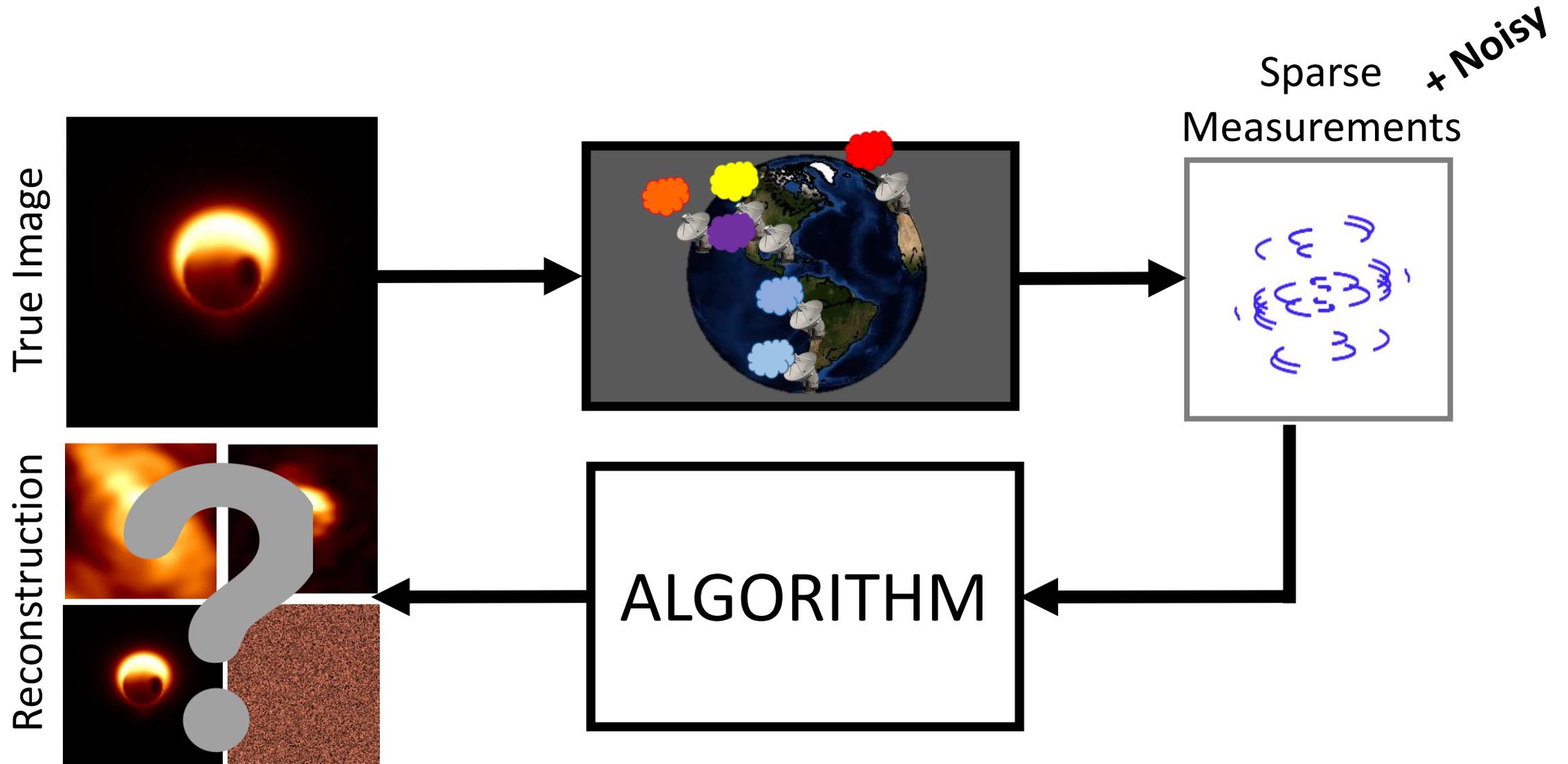
Image Credit:
Lindy Blackburn

Data Validation: statistical checks

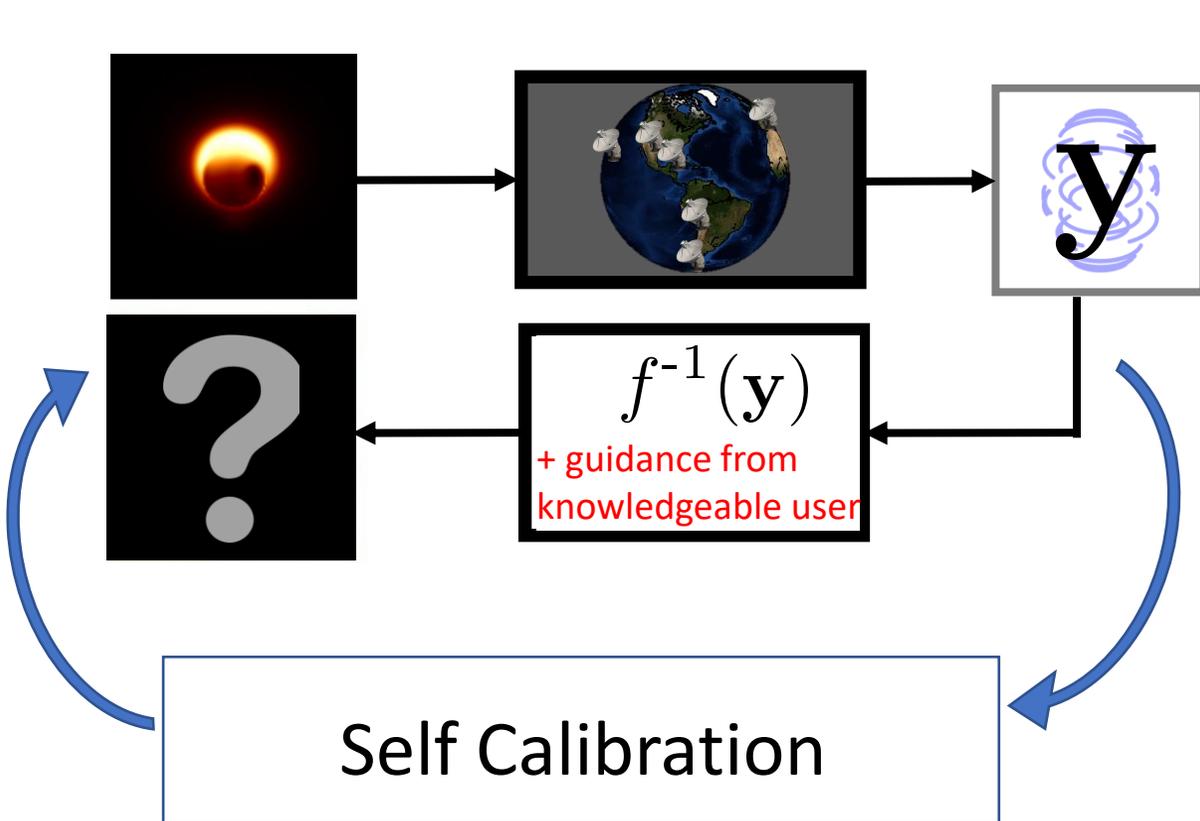


Verify calibration by pipeline cross-comparison across frequency bands, polarizations, and visibility quantities.

Solving for the Image

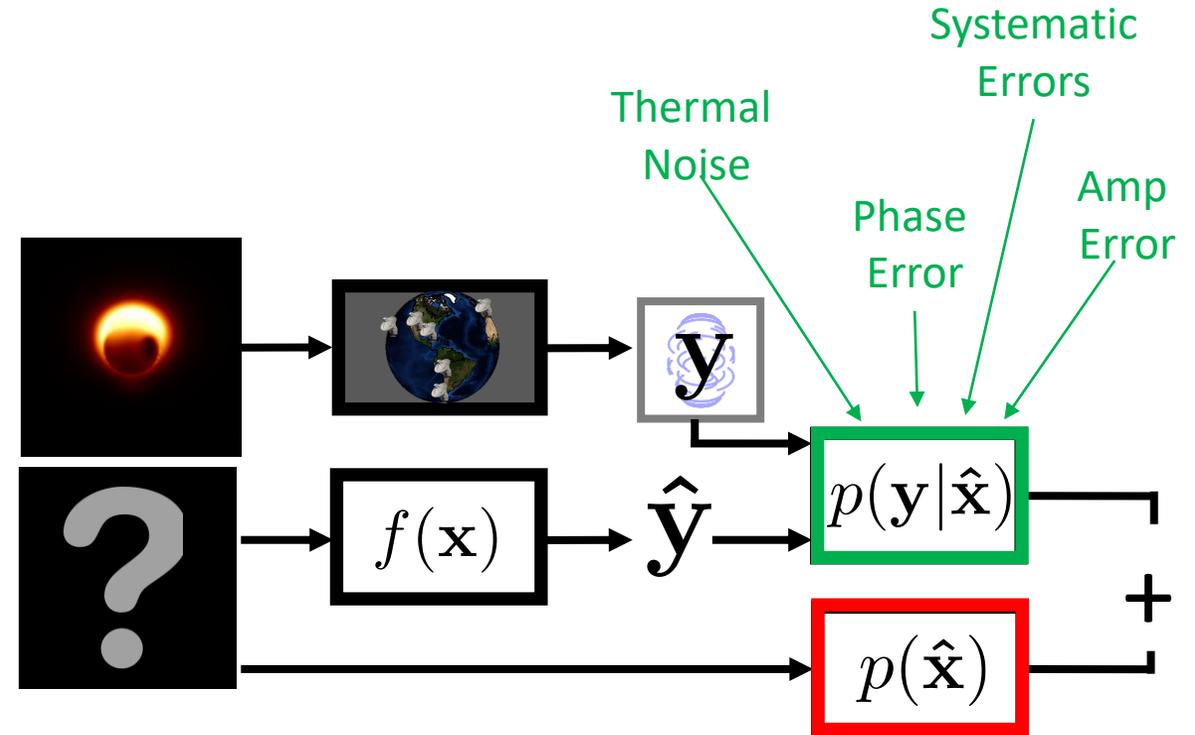


Two Classes of Imaging Algorithms



Standard

Inverse Modeling
(CLEAN + Self-Calibration)

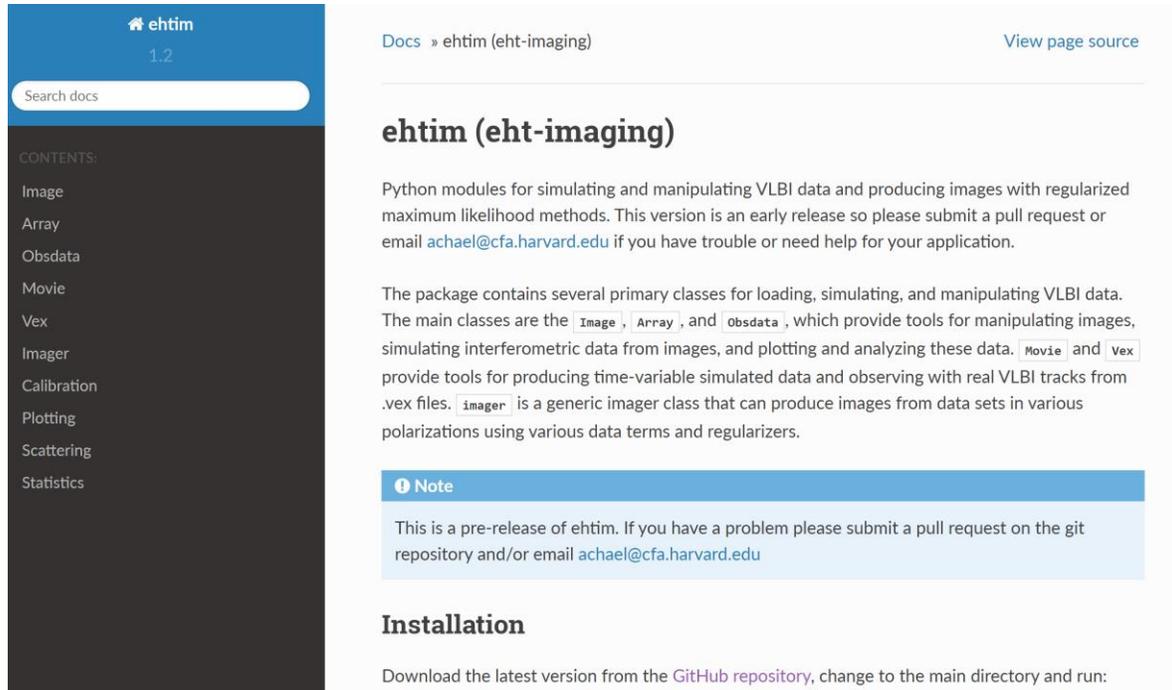


$$\hat{\mathbf{x}}_{\text{MAP}} = \operatorname{argmax}_{\mathbf{x}} [\log p(\mathbf{y}|\mathbf{x}) + \log p(\mathbf{x})]$$

Forward Modeling
(Regularized Maximum Likelihood)

RML Imaging software developed for the EHT

eht-imaging: Chael+,
Harvard/SAO



Docs » ehtim (eht-imaging) [View page source](#)

ehtim (eht-imaging)

Python modules for simulating and manipulating VLBI data and producing images with regularized maximum likelihood methods. This version is an early release so please submit a pull request or email achael@cfa.harvard.edu if you have trouble or need help for your application.

The package contains several primary classes for loading, simulating, and manipulating VLBI data. The main classes are the `Image`, `Array`, and `Obsdata`, which provide tools for manipulating images, simulating interferometric data from images, and plotting and analyzing these data. `Movie` and `Vex` provide tools for producing time-variable simulated data and observing with real VLBI tracks from `vex` files. `imager` is a generic imager class that can produce images from data sets in various polarizations using various data terms and regularizers.

Note

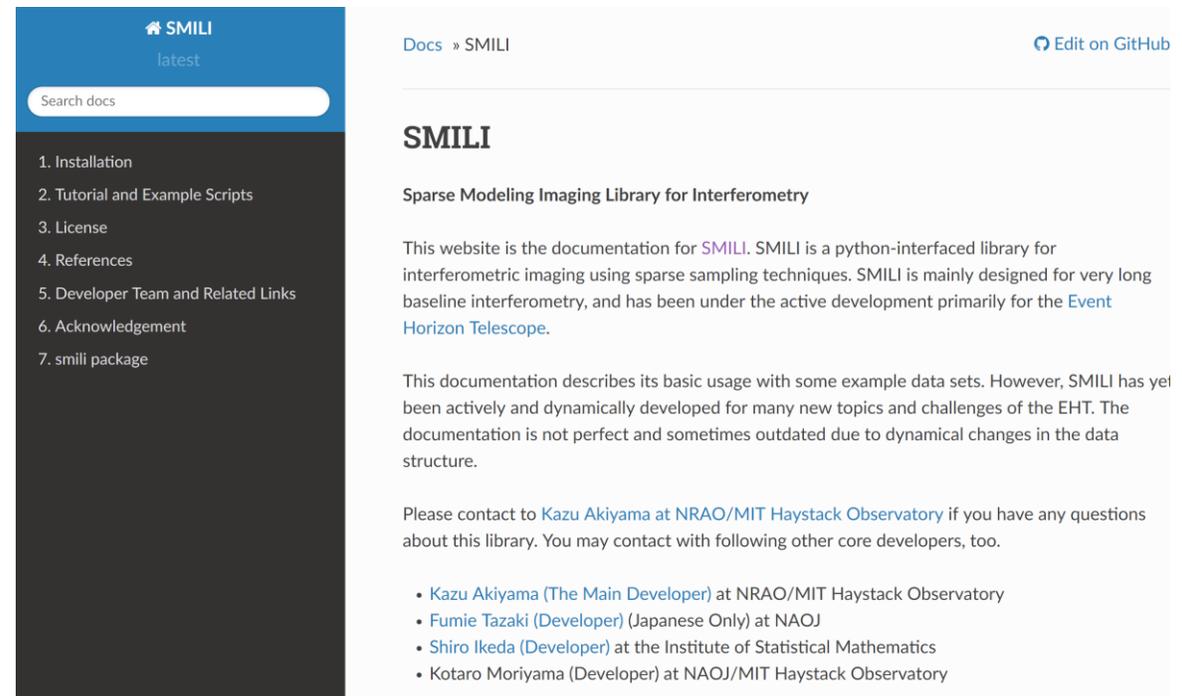
This is a pre-release of ehtim. If you have a problem please submit a pull request on the git repository and/or email achael@cfa.harvard.edu

Installation

Download the latest version from the [GitHub repository](#), change to the main directory and run:

<https://github.com/achael/eht-imaging>

SMILI: Kazu Akiyama+,
MIT Haystack / NAOJ



Docs » SMILI [Edit on GitHub](#)

SMILI

Sparse Modeling Imaging Library for Interferometry

This website is the documentation for [SMILI](#). SMILI is a python-interfaced library for interferometric imaging using sparse sampling techniques. SMILI is mainly designed for very long baseline interferometry, and has been under the active development primarily for the [Event Horizon Telescope](#).

This documentation describes its basic usage with some example data sets. However, SMILI has yet been actively and dynamically developed for many new topics and challenges of the EHT. The documentation is not perfect and sometimes outdated due to dynamical changes in the data structure.

Please contact to [Kazu Akiyama at NRAO/MIT Haystack Observatory](#) if you have any questions about this library. You may contact with following other core developers, too.

- [Kazu Akiyama \(The Main Developer\)](#) at NRAO/MIT Haystack Observatory
- [Fumie Tazaki \(Developer\)](#) (Japanese Only) at NAOJ
- [Shiro Ikeda \(Developer\)](#) at the Institute of Statistical Mathematics
- [Kotaro Moriyama \(Developer\)](#) at NAOJ/MIT Haystack Observatory

<https://github.com/astrosmili/smili>

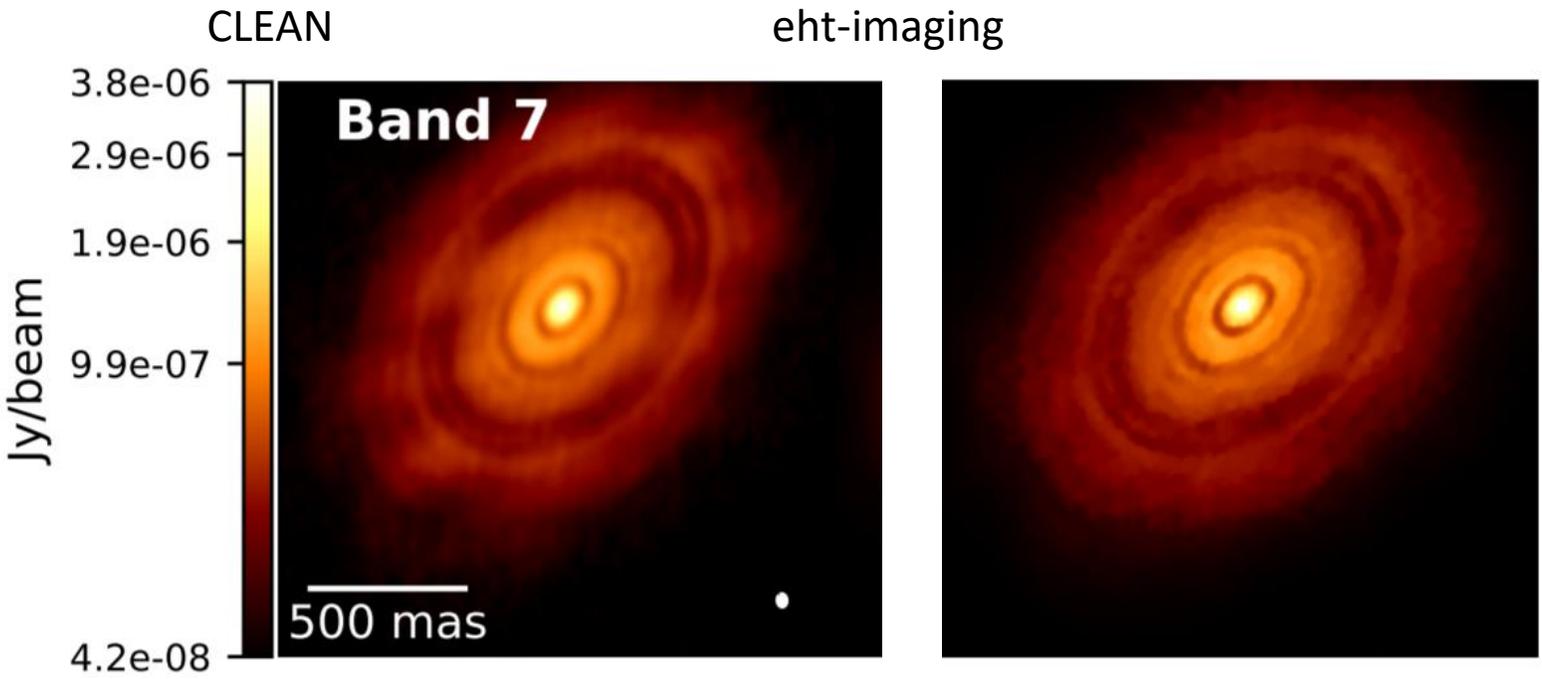
RML Imaging software developed for the EHT -- but with wide applicability

eht-imaging
Harvard

Search docs

CONTENTS:

- Image
- Array
- Obsdata
- Movie
- Vex
- Imager
- Calibration
- Plotting
- Scattering
- Statistics



[Edit on GitHub](#)

on-interfaced library for
MILI is mainly designed for very long
opment primarily for the [Event](#)

ple data sets. However, SMILI has yet
s and challenges of the EHT. The
o dynamical changes in the data

[servatory](#) if you have any questions
developers, too.

[ack Observatory](#)

ematics
servatory

The eht-imaging software library

Branch: master

Go to file Add file Code

achael committed 50e728c on May 20 1,890 commits 6 branches 8 tags

| | | |
|------------------------|---|---------------|
| .github/ISSUE_TEMPLATE | Update issue templates | 7 months ago |
| arrays | added untracked array and example script, probably outdated | 2 months ago |
| data | overwrite old master | 3 years ago |
| docs | updated readme and setup | 2 months ago |
| ehtim | fixed bug in setup.py and summary_plots | 2 months ago |
| examples | added untracked array and example script, probably outdated | 2 months ago |
| models | added rowan and howes | 2 years ago |
| scripts | merged into master | 2 months ago |
| .gitignore | modified gitignore | 2 months ago |
| .mailmap | Add a ".mailmap" file | 3 years ago |
| Dockerfile | add dockerfile | 15 months ago |
| LICENSE.txt | Create LICENSE | 2 years ago |
| README.rst | modified README | 2 months ago |
| requirements.txt | update dependencies | 15 months ago |
| setup.cfg | updated readme and setup | 2 months ago |
| setup.py | modified README | 2 months ago |

About

Imaging, analysis, and simulation software for radio interferometry

[achael.github.io/eht-imaging/](https://github.com/achael/eht-imaging/)

Readme

GPL-3.0 License

Releases 8

v1.2.1 Latest on May 20

+ 7 releases

Packages

No packages published

[Publish your first package](#)

Contributors 18

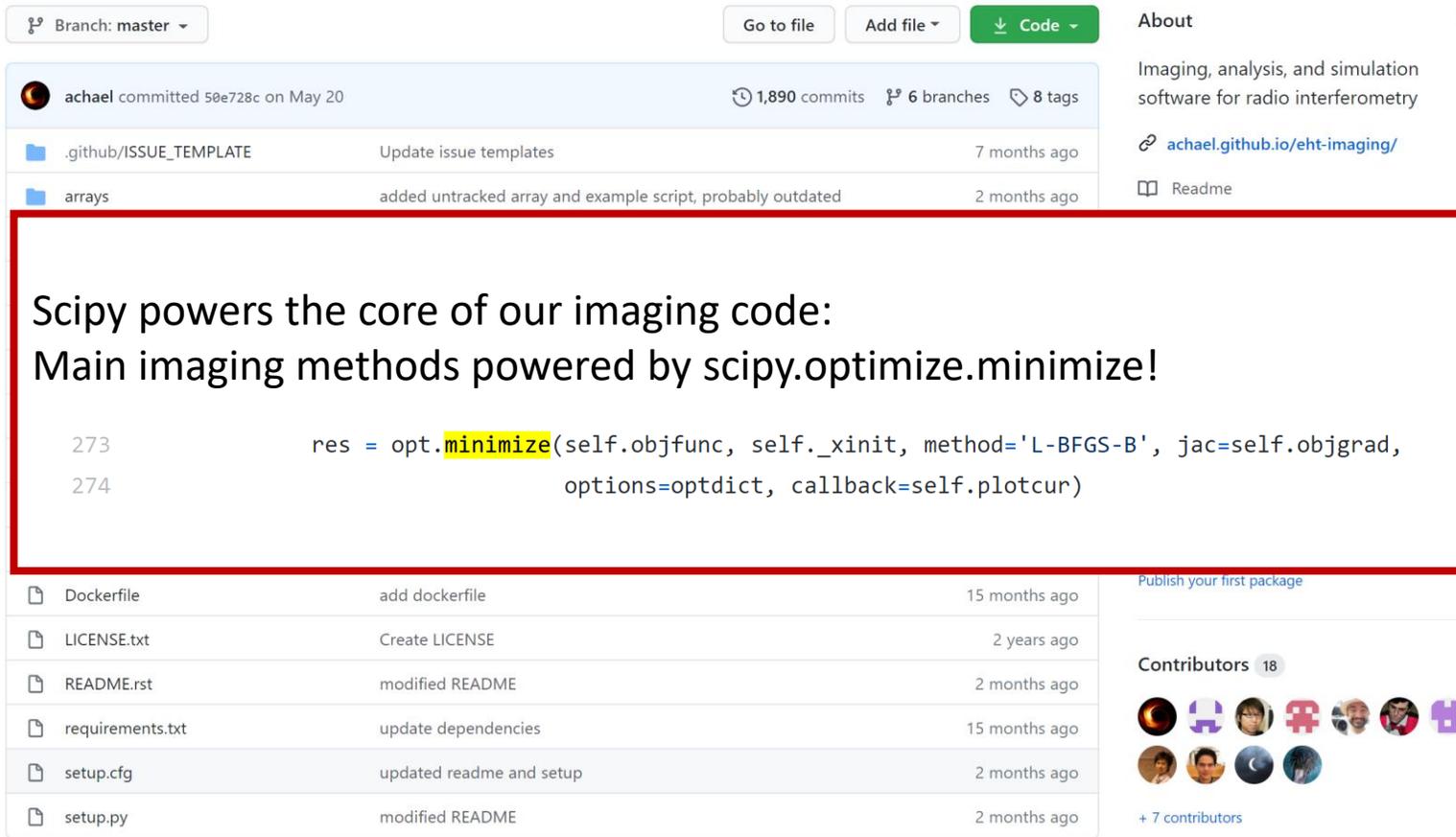
+ 7 contributors

- Python software to image, analyze, manipulate, simulate interferometric data
- A lot of domain-specific code built up for data handling, but numpy+scipy power the main tasks!
- Flexible framework for developing new tools for imaging and model fitting

<https://github.com/achael/eht-imaging>

Chael+ 2016, 2018

The eht-imaging software library



Branch: master

Go to file Add file Code

About
Imaging, analysis, and simulation software for radio interferometry
achael.github.io/eht-imaging/
Readme

achael committed 50e728c on May 20
1,890 commits 6 branches 8 tags

.github/ISSUE_TEMPLATE Update issue templates 7 months ago

arrays added untracked array and example script, probably outdated 2 months ago

Scipy powers the core of our imaging code:
Main imaging methods powered by `scipy.optimize.minimize`!

```
273         res = opt.minimize(self.objfunc, self._xinit, method='L-BFGS-B', jac=self.objgrad,  
274                          options=optdict, callback=self.plotcur)
```

Dockerfile add dockerfile 15 months ago

LICENSE.txt Create LICENSE 2 years ago

README.rst modified README 2 months ago

requirements.txt update dependencies 15 months ago

setup.cfg updated readme and setup 2 months ago

setup.py modified README 2 months ago

Publish your first package

Contributors 18

+ 7 contributors

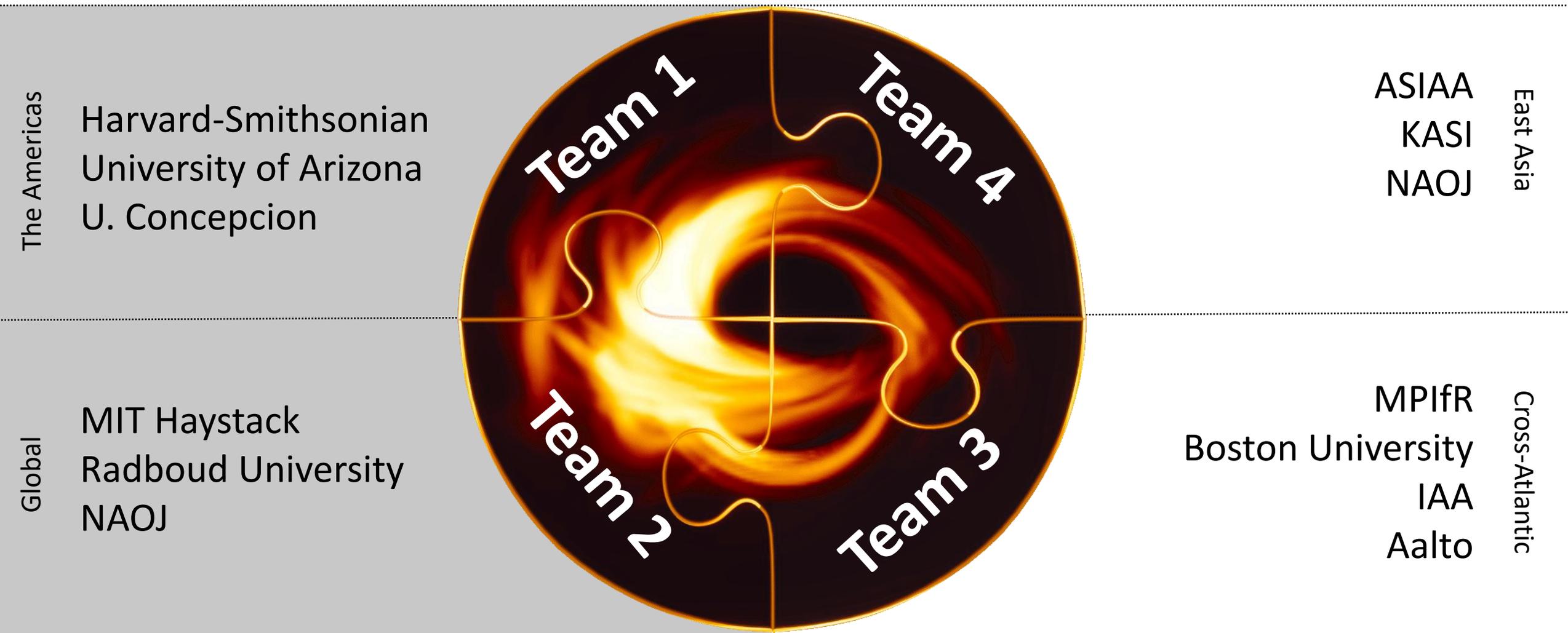
- Python software to image, analyze, manipulate, simulate interferometric data
- A lot of domain-specific code built up for data handling, but numpy+scipy power the main tasks!
- Flexible framework for developing new tools for imaging and model fitting

<https://github.com/achael/eht-imaging>

Chael+ 2016, 2018

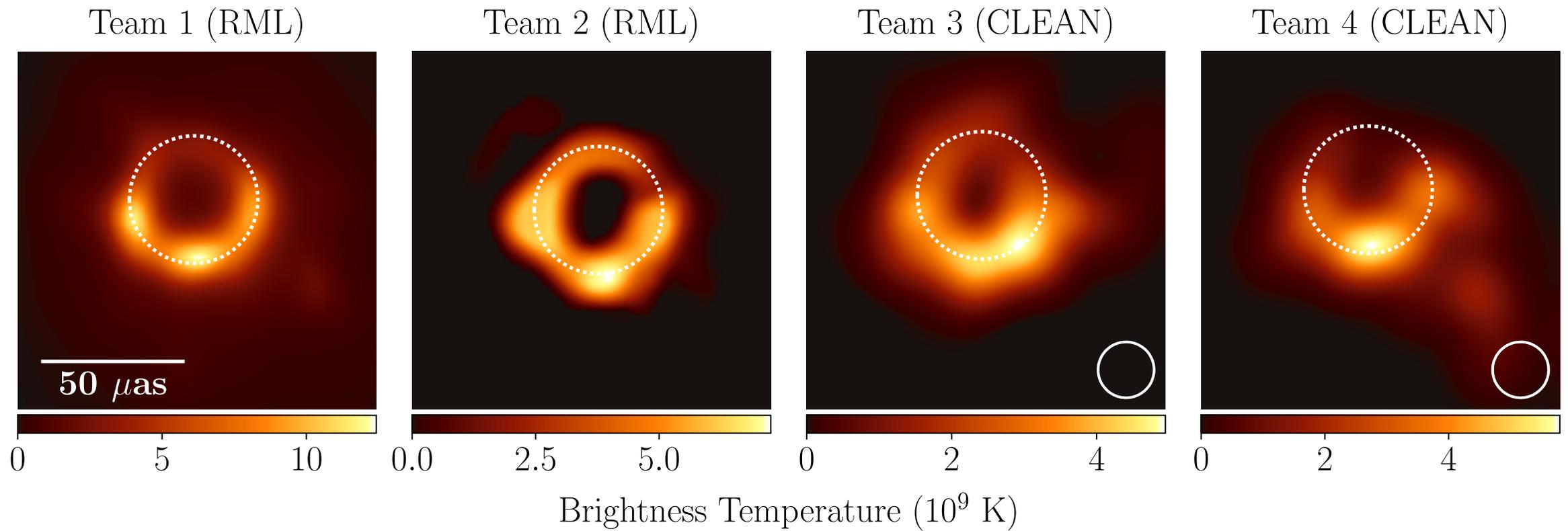
How do we verify what we are
reconstructing is real?

Step 1: Blind Imaging

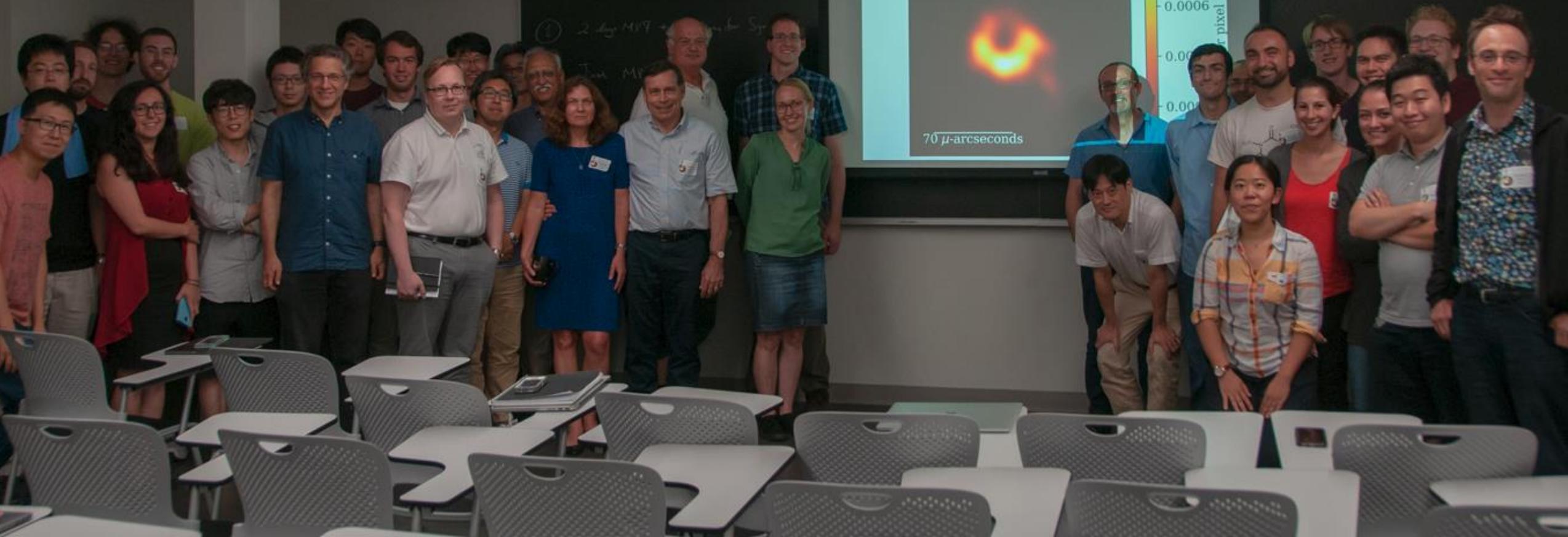


7 weeks later...

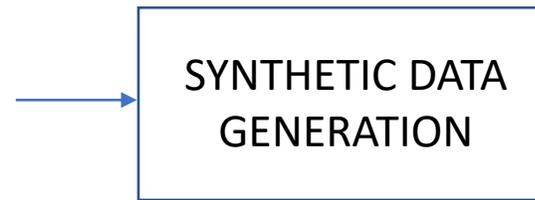
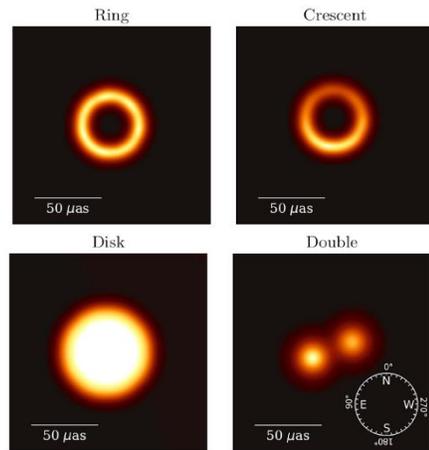
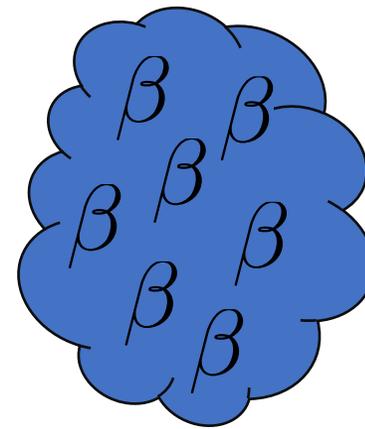
Step 1: Blind Imaging



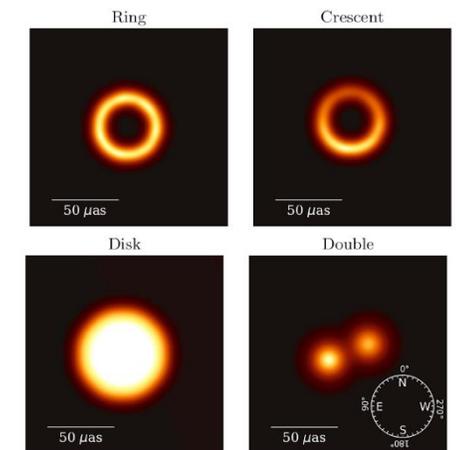
EXIT



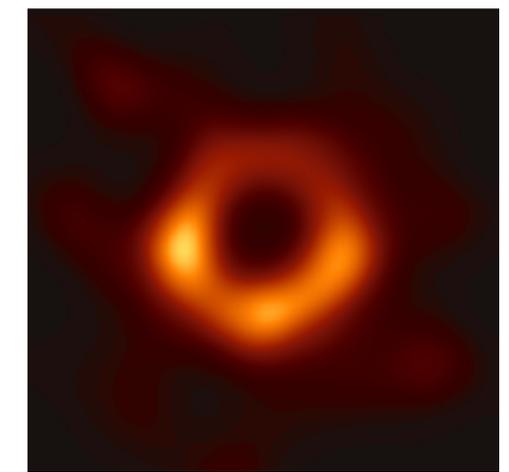
Step 2: Test 30,000+ hyperparameter sets



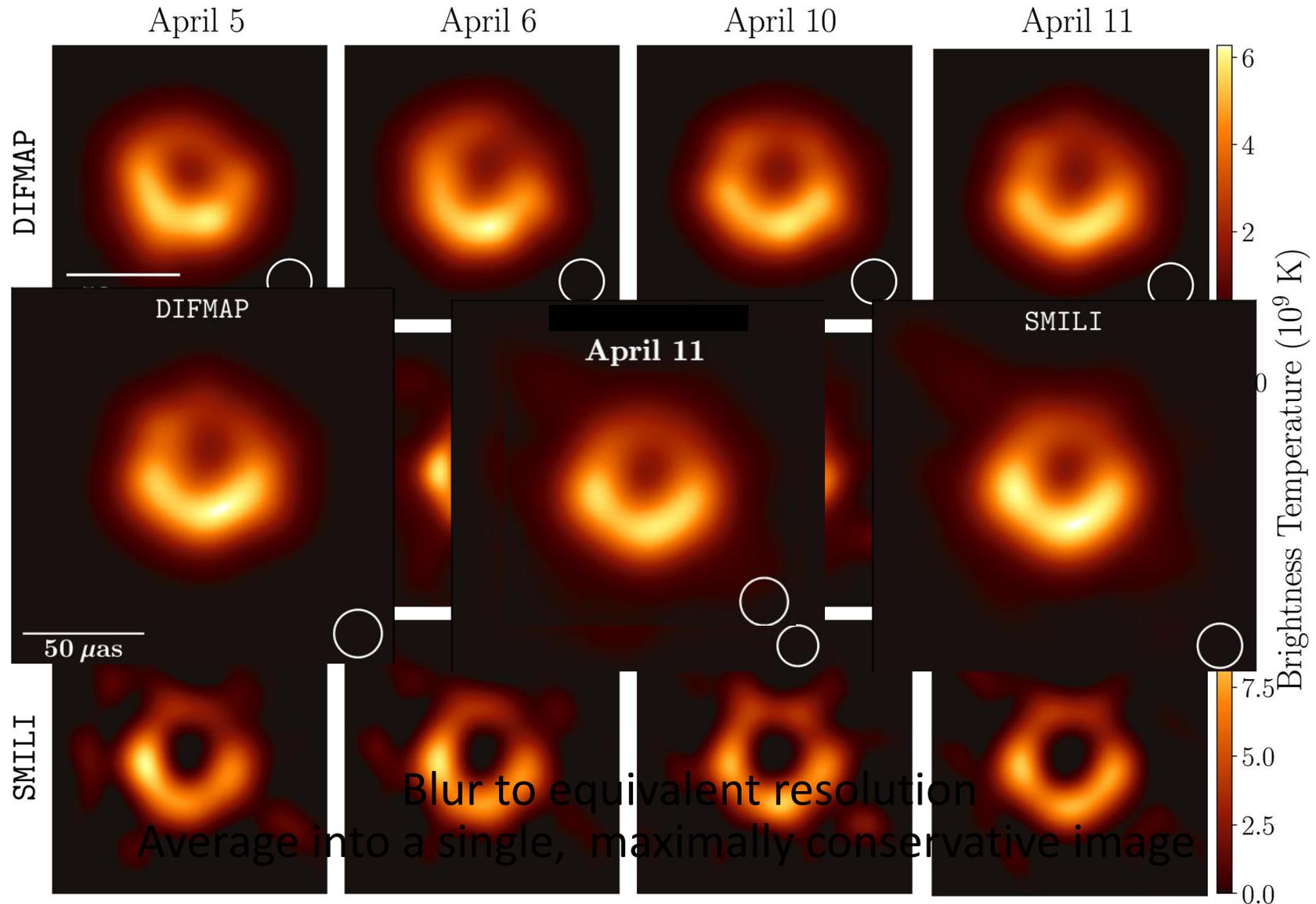
Fake Data



M87 Data

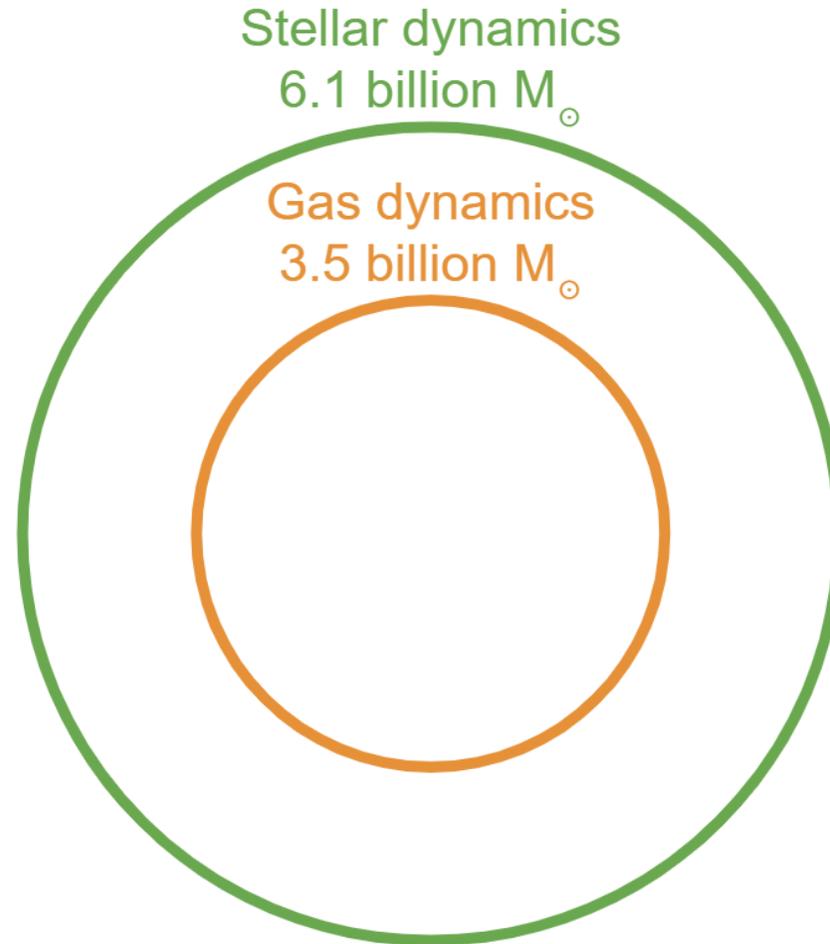


Three pipelines, four days

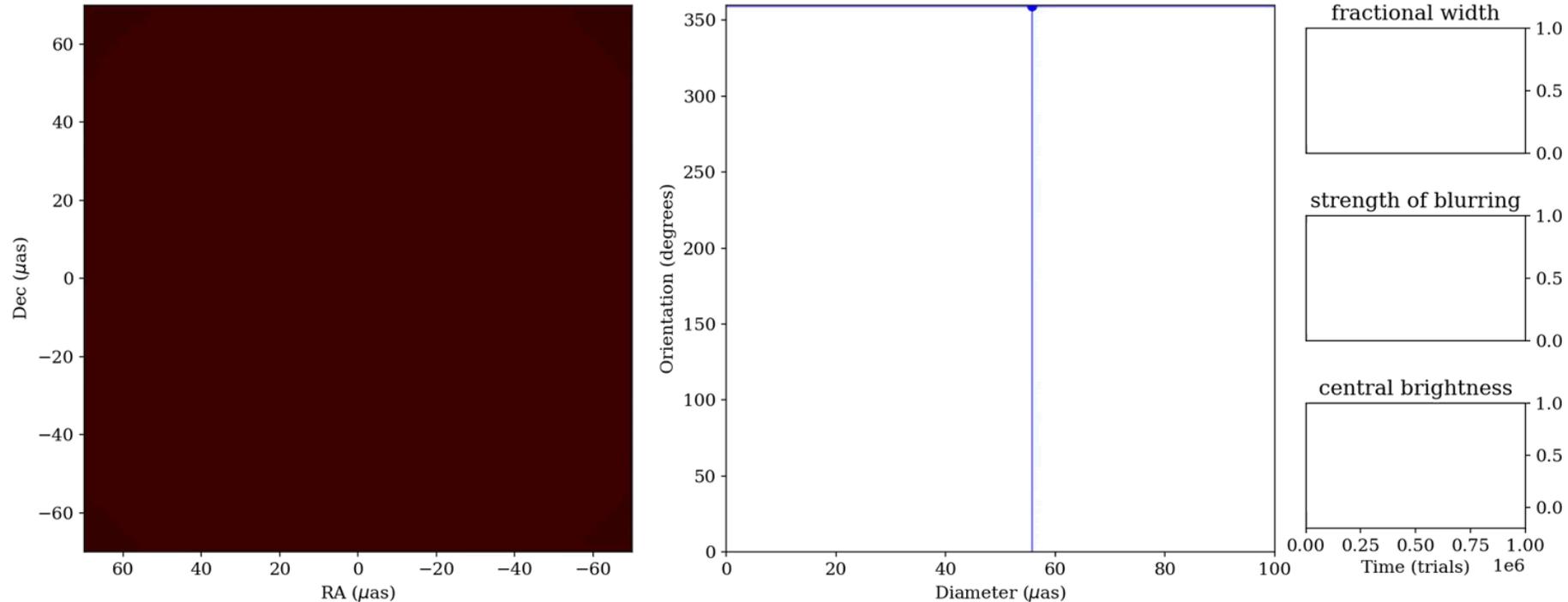


What does this image tell us?

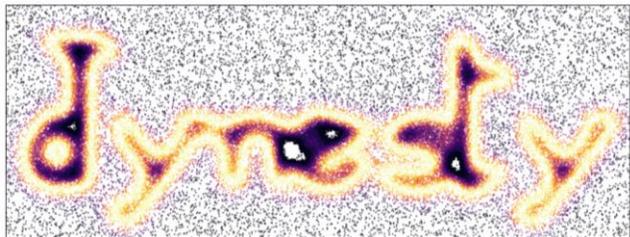
Previous measurements of the M87 black hole mass disagreed!



Weighing a black hole with nested sampling



dynesty

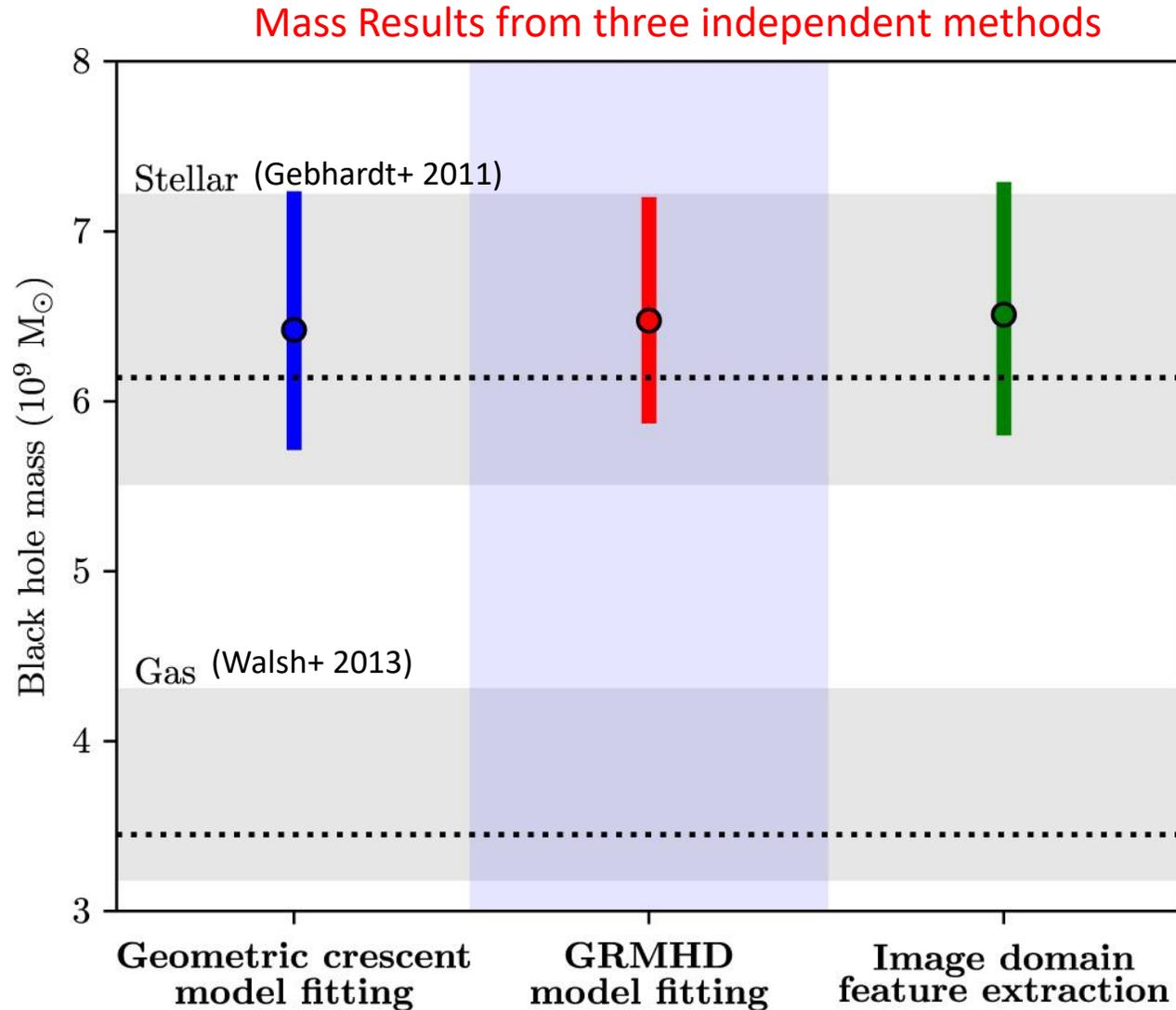


Dynesty: pure python nested sampling code
<https://github.com/joshspeagle/dynesty>

Also used several results from other MCMC codes and image reconstructions

Animation Credit: Dom Pesce

Directly weighing a black hole with $r_{\text{shadow}} = \sqrt{27}GM/c^2$



$$M = (6.5 \pm 0.7) \times 10^9 M_{\odot}$$

EHT BLACK HOLE IMAGE
SOURCE: NSF

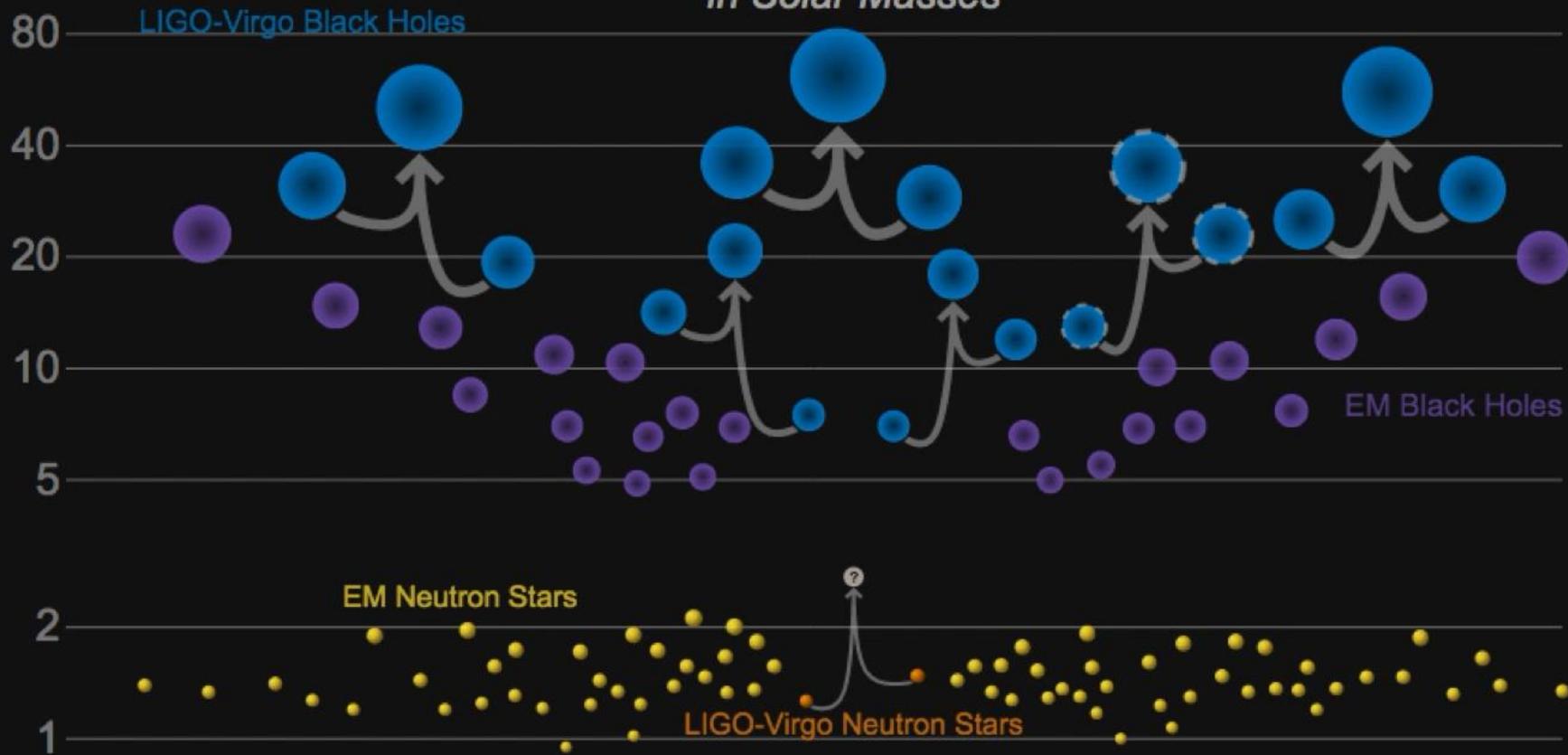


$$M = (6.5 \pm 0.7) \times 10^9 M_{\odot}$$

$$R_{\text{Sch}} = 128 \text{ AU}$$

Masses in the Stellar Graveyard

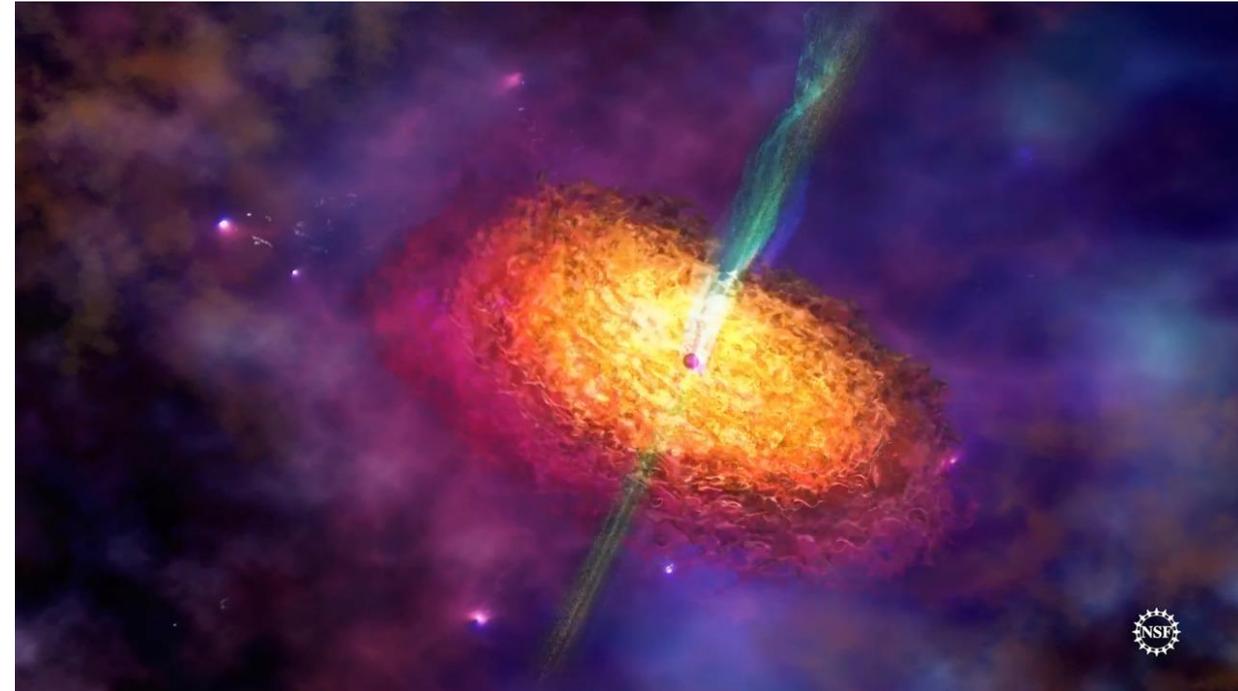
in Solar Masses



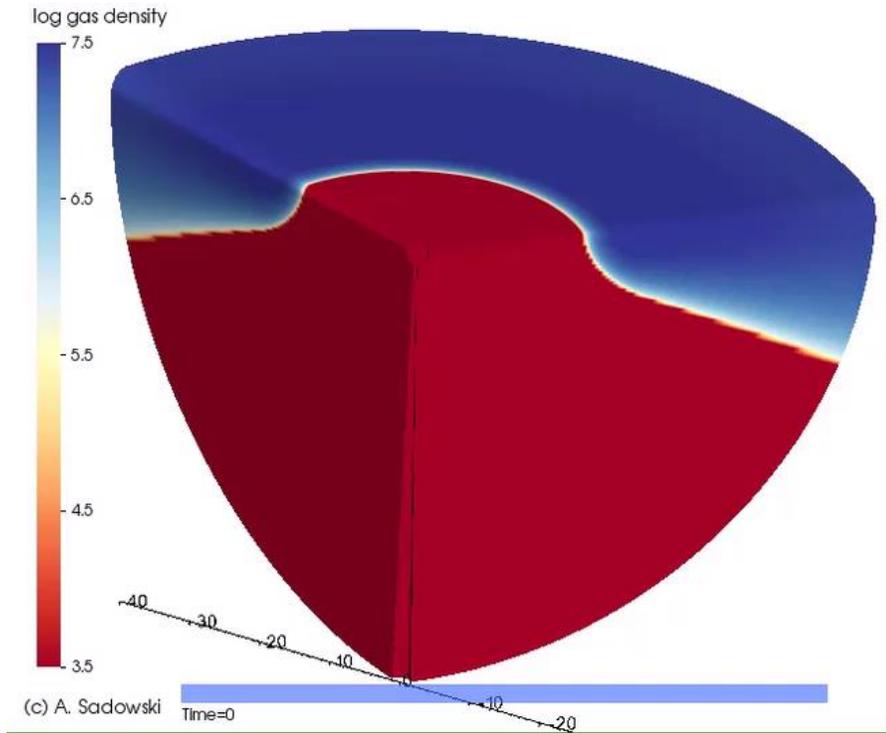
LIGO-Virgo | Frank Elavsky | Northwestern

M87's physical environment: what's going on near the event horizon?

- Thick accretion disk of hot plasma (tens of billions of degrees K)
 - produces the strongest emission in sub-mm where the EHT observes!
- Strong and turbulent magnetic fields
- Launches a powerful relativistic jet



General Relativistic MagnetoHydroDynamics



General Relativistic Ray Tracing



Solves coupled equations of fluid dynamics and magnetic field in a black hole spacetime

Tracks light rays and solves for the emitted radiation



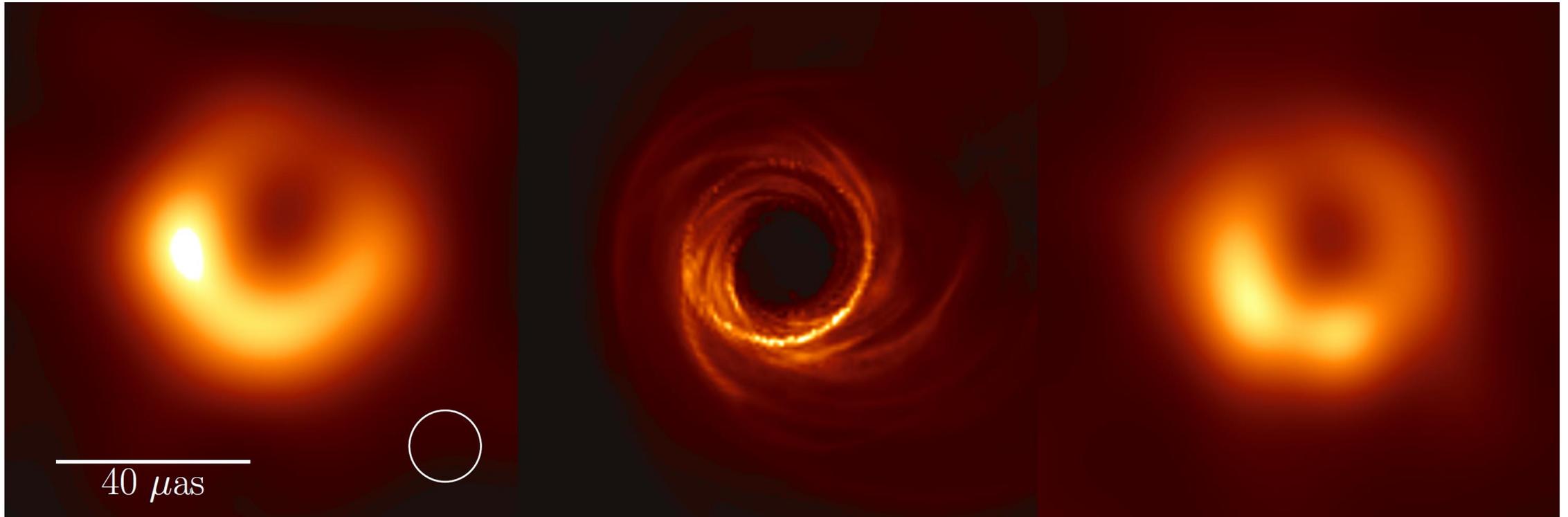
Image Library: > 60,000 simulation snapshots

Matching Simulations and Images

EHT 2017 image

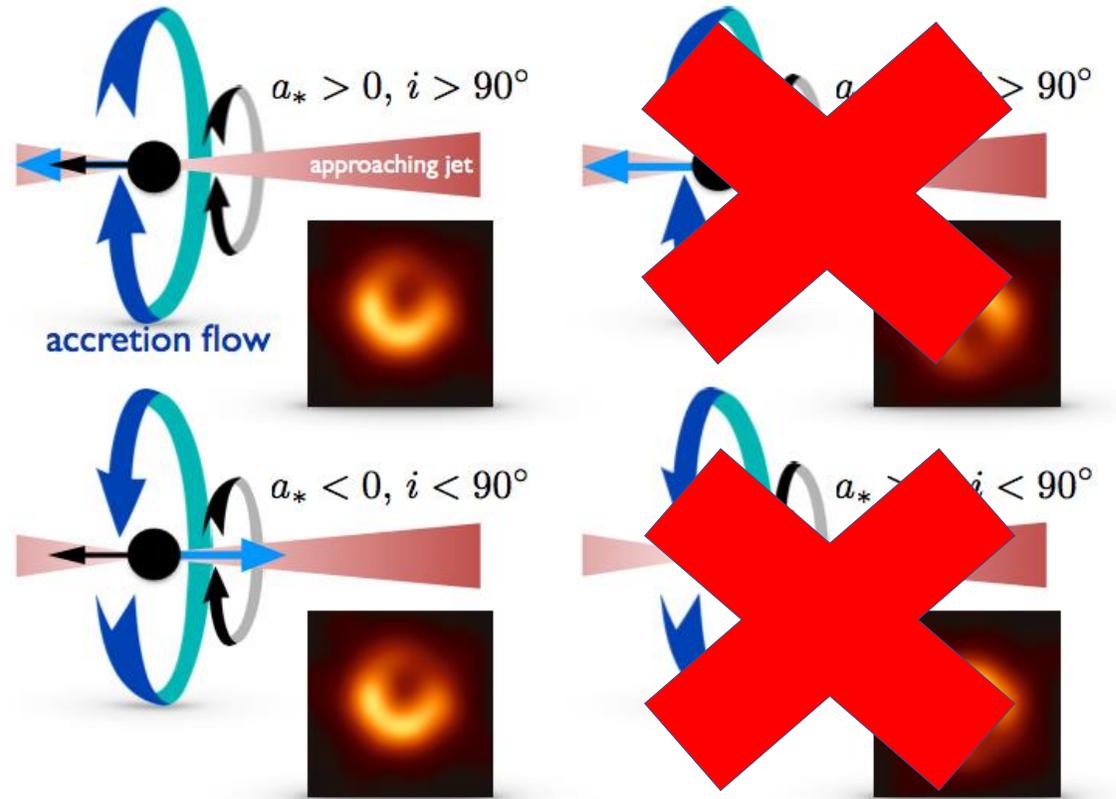
Simulated image
from (my) GRMHD model

Simulated image reconstructed
with EHT pipeline



Ring Asymmetry and Black Hole Spin

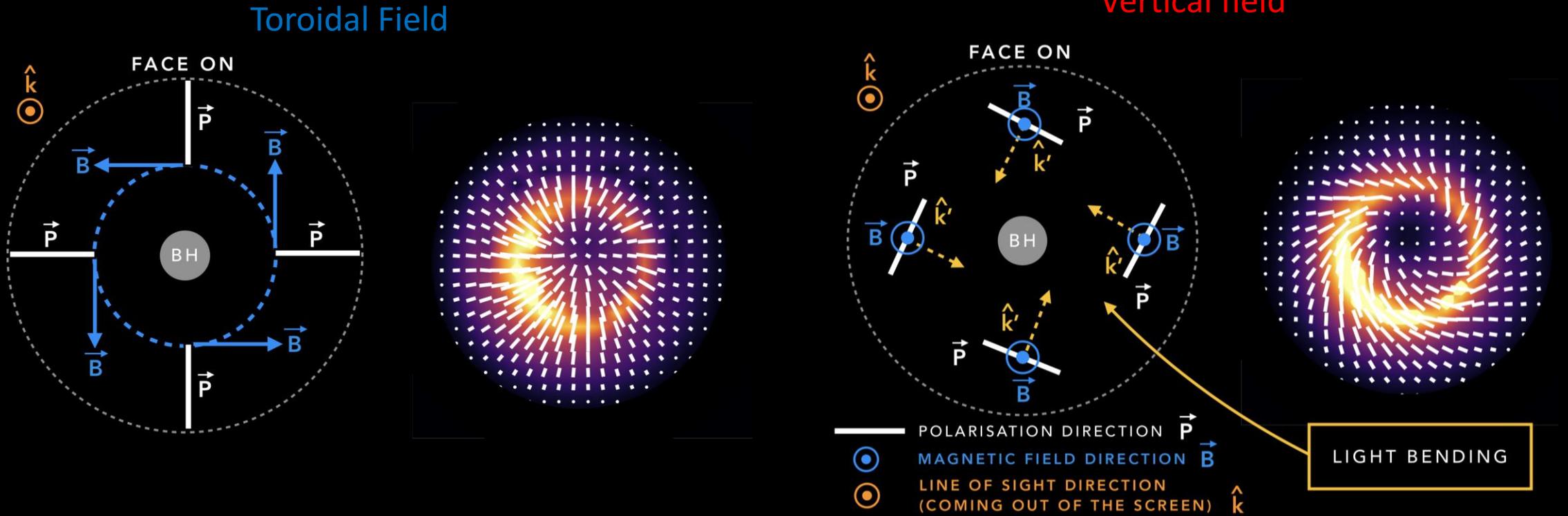
BH angular momentum determines the image orientation



BH spin-away (clockwise rotation) models are strongly favored

Next Steps

Polarization traces magnetic fields



Polarization Image Coming Soon!

Sagittarius A*

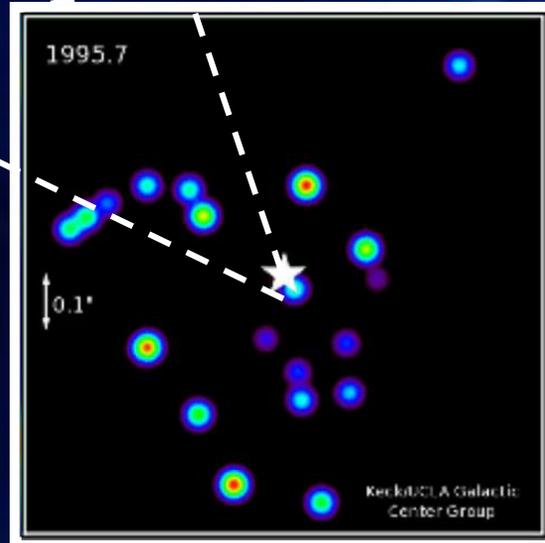
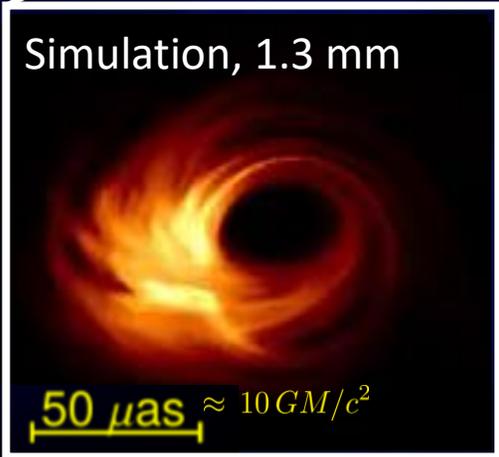
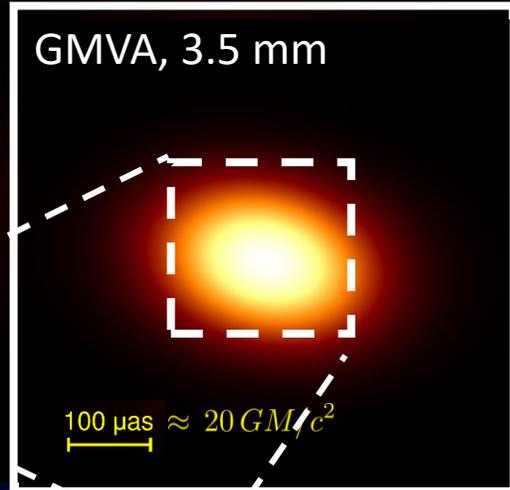
VLA, 6 cm

$$M_{BH} = (4.10 \pm 0.03) \times 10^6 M_{\odot}$$

$$D = (8.12 \pm 0.03) \text{kpc}$$

Gravity Collaboration, 2018

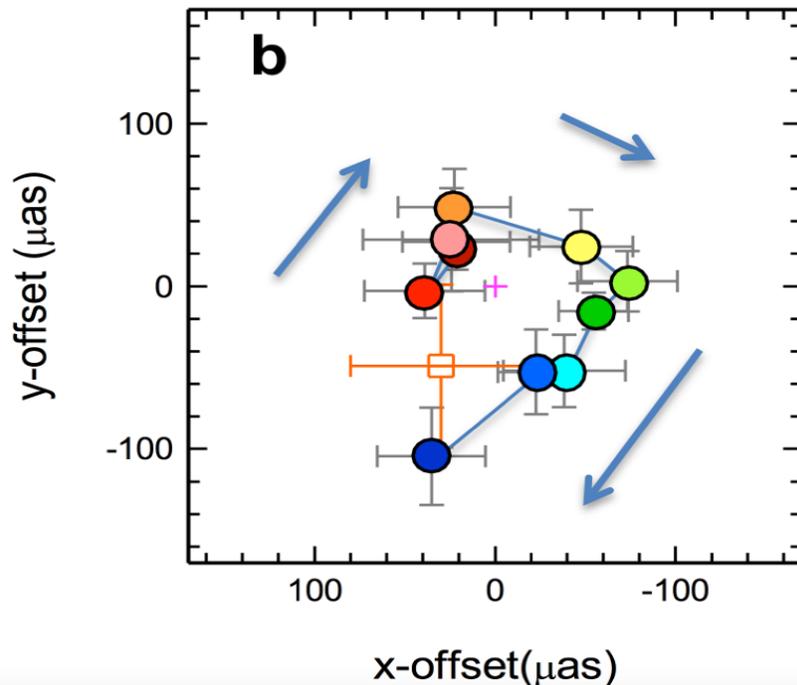
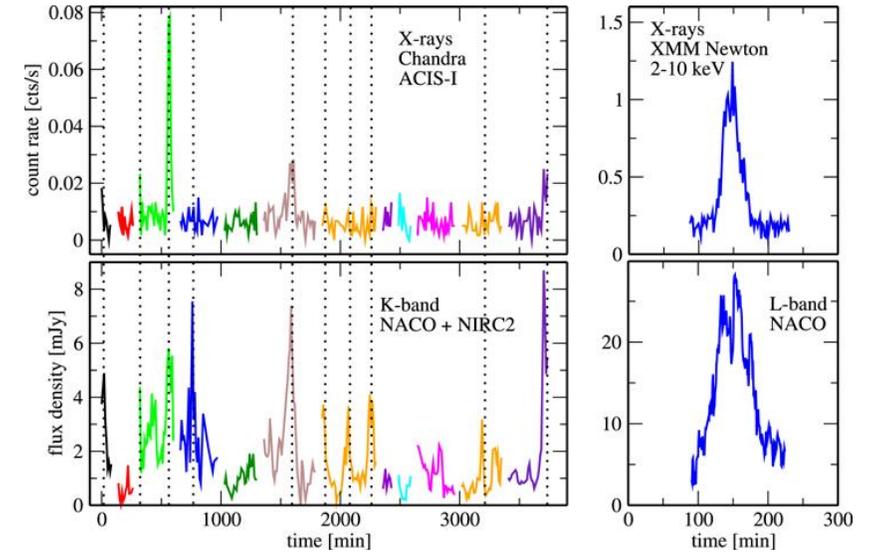
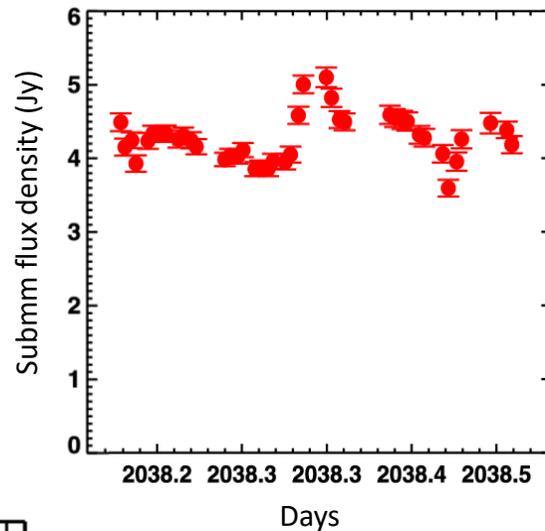
$$d_{\text{shadow}} \approx 50 \mu\text{as}$$



20 as
 $\sim 10^6 GM/c^2$

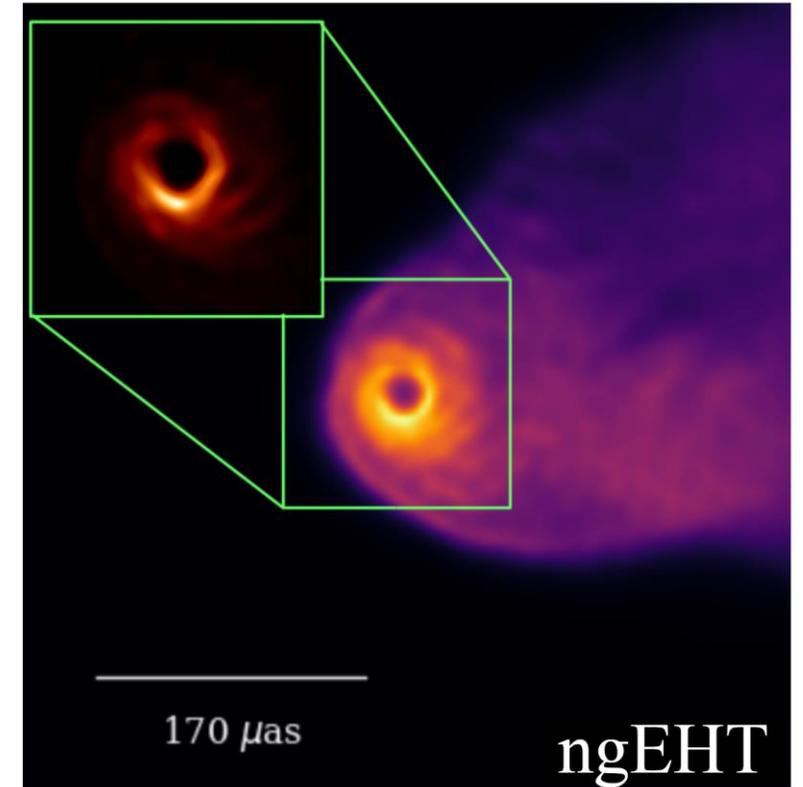
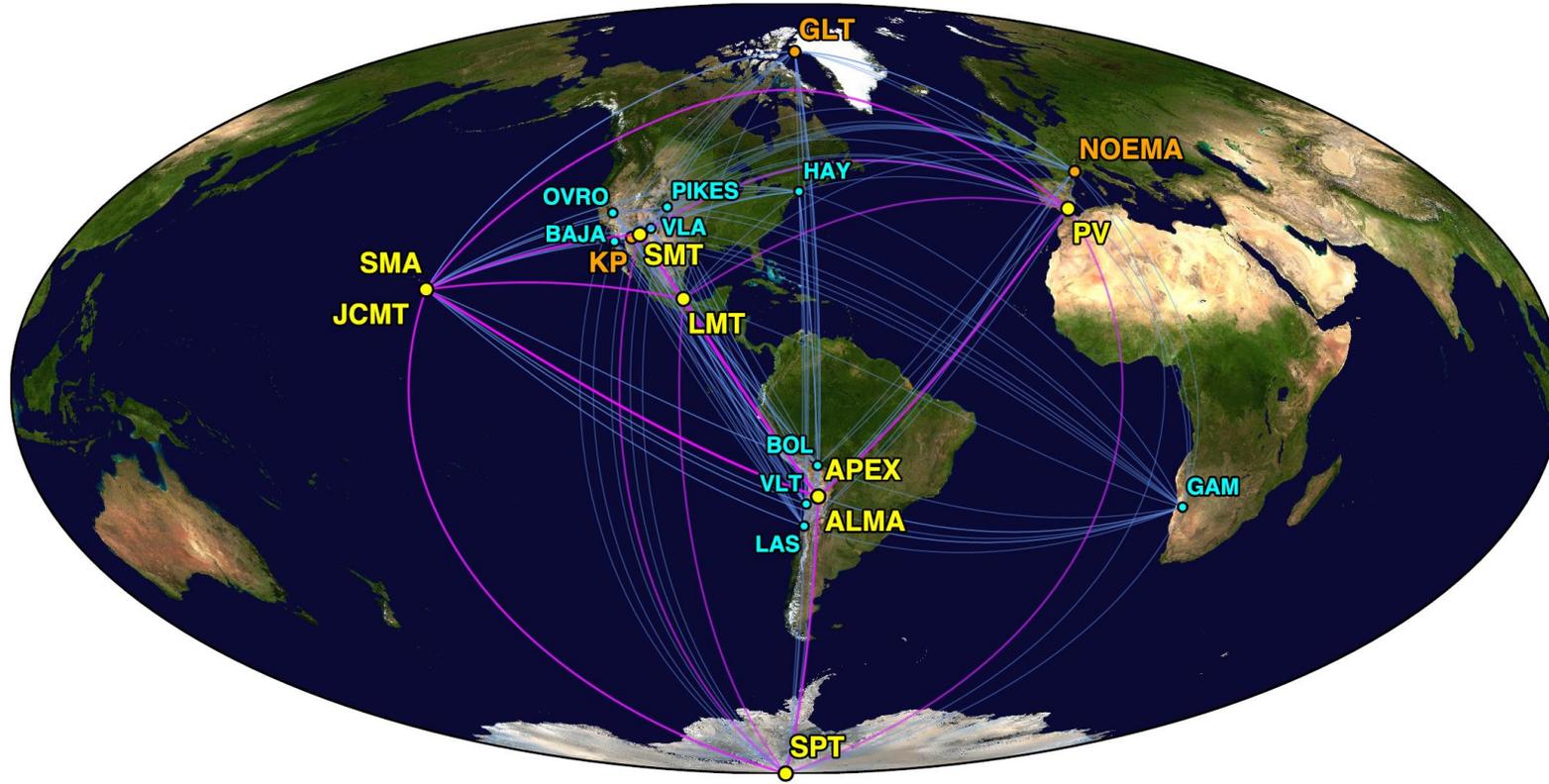
Time variability: Sgr A* Flares

- Intra-day 1.3 mm variability in Sgr A* on minute-hour timescales makes imaging very hard!



- GRAVITY NIR Interferometry: flares rotate near the horizon, $R \sim 3 - 5 R_{\text{Sch}}$, $v \sim 0.2 - 0.3c$

ngEHT will illuminate the BH-jet connection



The current EHT lacks short baselines, which are necessary to detect extended structure.

Idea: add many more small, ~6m dishes to the array

See: EHT Ground Astro2020 APC White Paper (Blackburn, Doeleman+; arXiv:1909.01411)

Summary:

- **The EHT has captured the first image of a black hole shadow in M87.**
- The EHT is composed of diverse radio telescopes around the world combined into one instrument with years of collaboration and technical development
- EHT data is reduced from petabytes of recordings to kilobyte images; the data are uniquely challenging to calibrate because of the high observing frequency.
- EHT images were reconstructed from sparse data with multiple independent pipelines
- Simulations suggest that the M87 black hole is spinning and that the jet is formed by the extraction of the BH spin energy.
- The black hole mass in M87 can be measured from the shadow size; it is **really** heavy

