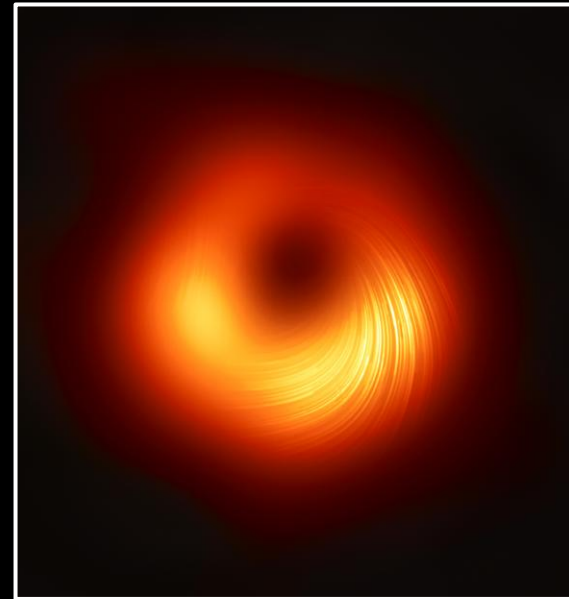
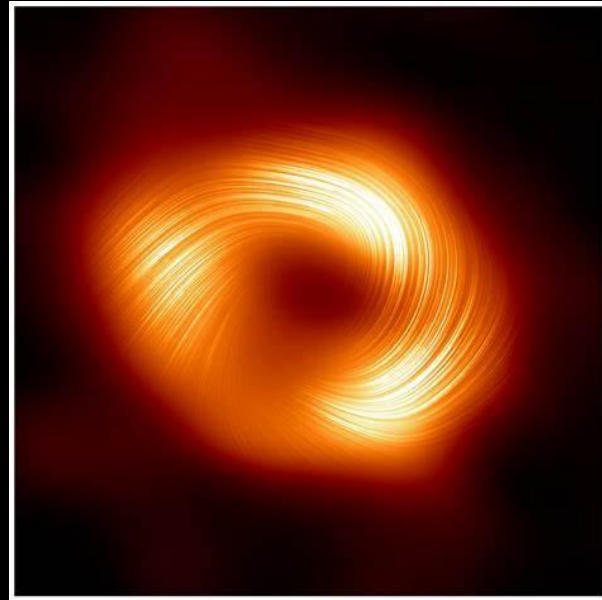


Imaging Black Holes with the Event Horizon Telescope

Andrew Chael

Princeton University

July 16, 2025



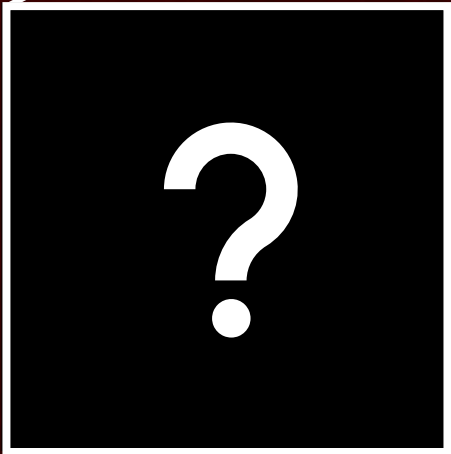
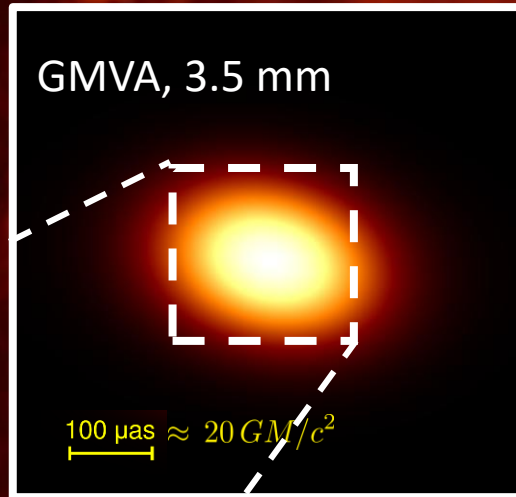
Sgr A*

JVLA, 6 cm

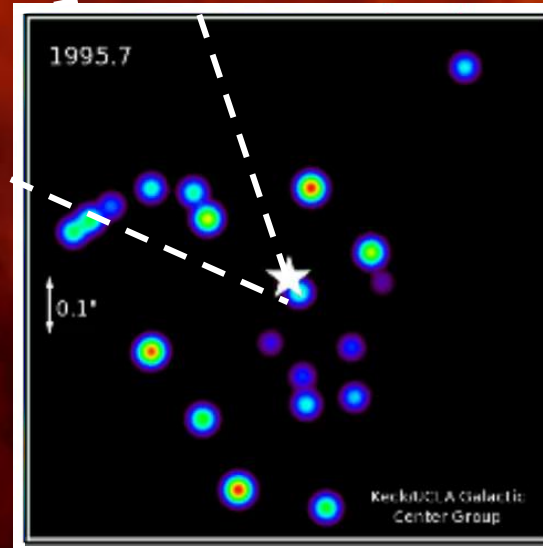
$$M_{BH} = (4.10 \pm 0.03) \times 10^6 M_{\odot}$$

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

Gravity Collaboration, 2018



What does a black hole look like on event horizon scales?



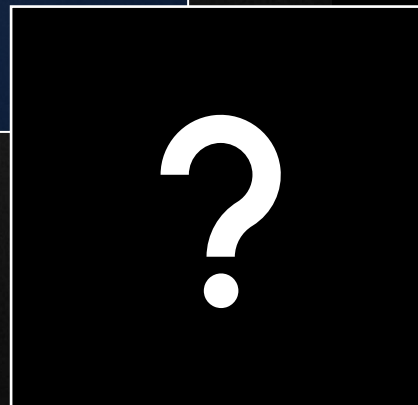
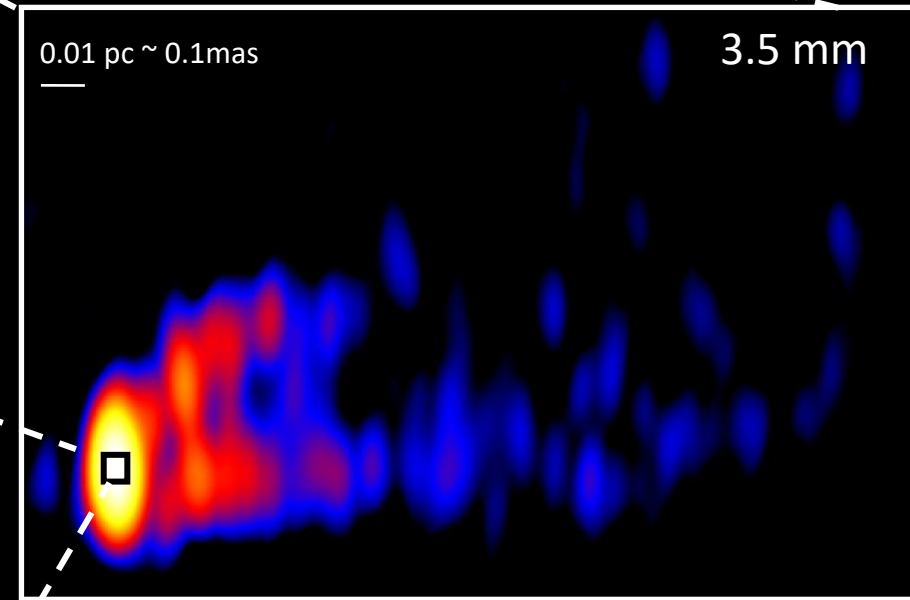
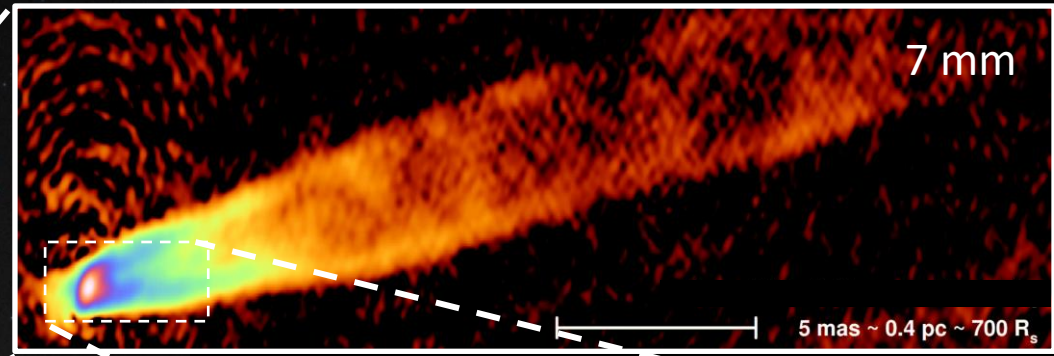
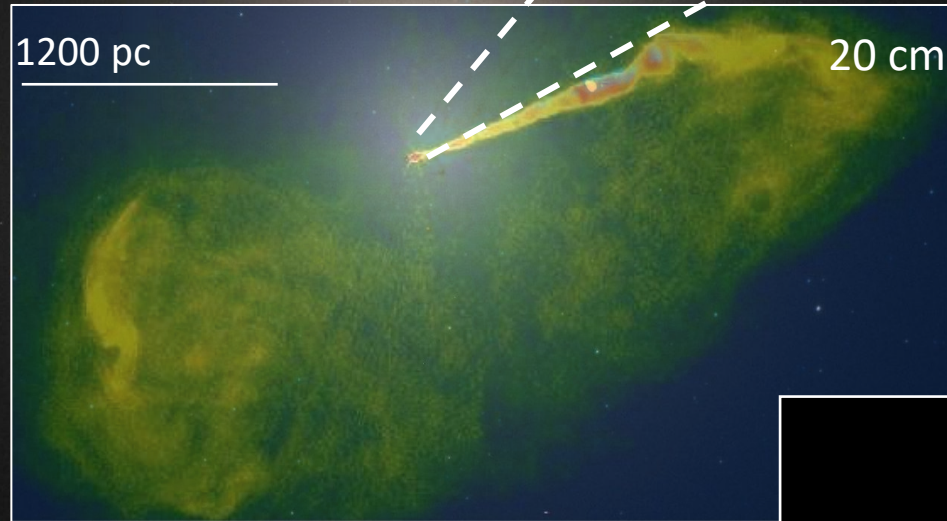
20 as
 $\sim 10^6 GM/c^2$

Image credits: K.Y. Lo (VLA), UCLA Galactic Center Group (Keck), Issaoun+ 2019, 2021 (GMVA+ALMA 3mm image), EHT (1.3mm)

M87 & M87*

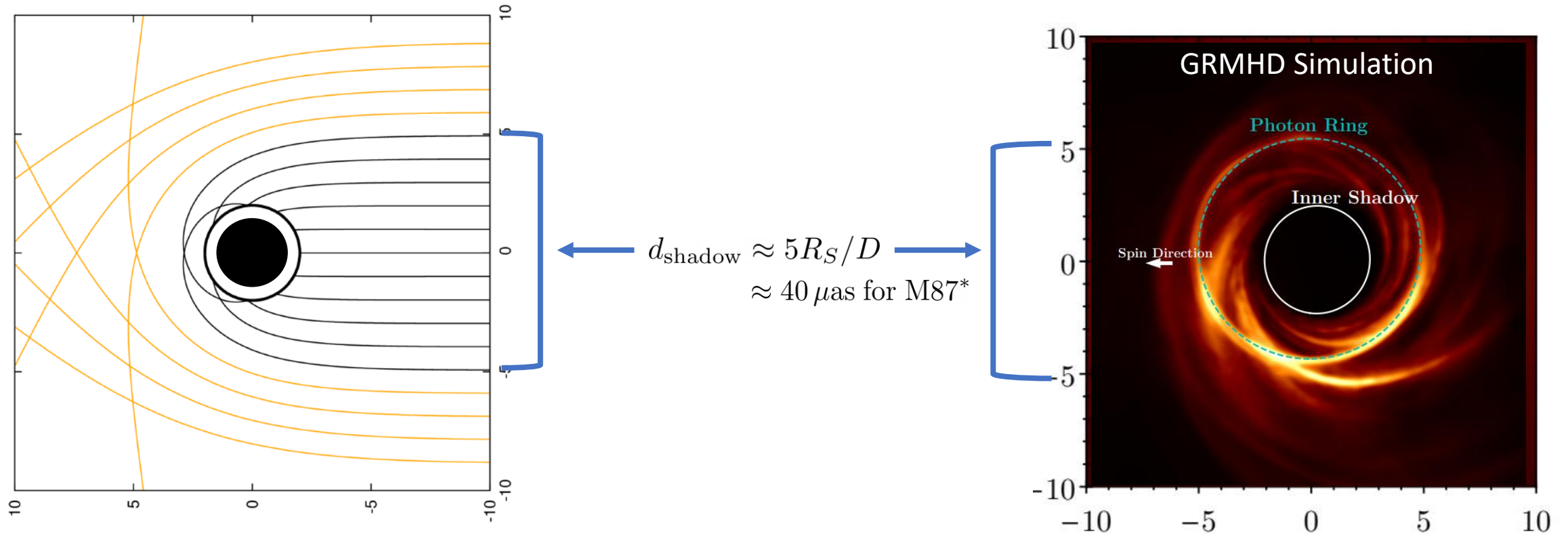
$$M_{BH} = (6.5 \pm 0.7) \times 10^9 M_{\odot}$$

$$D = (16.8 \pm 0.8) \text{Mpc}$$



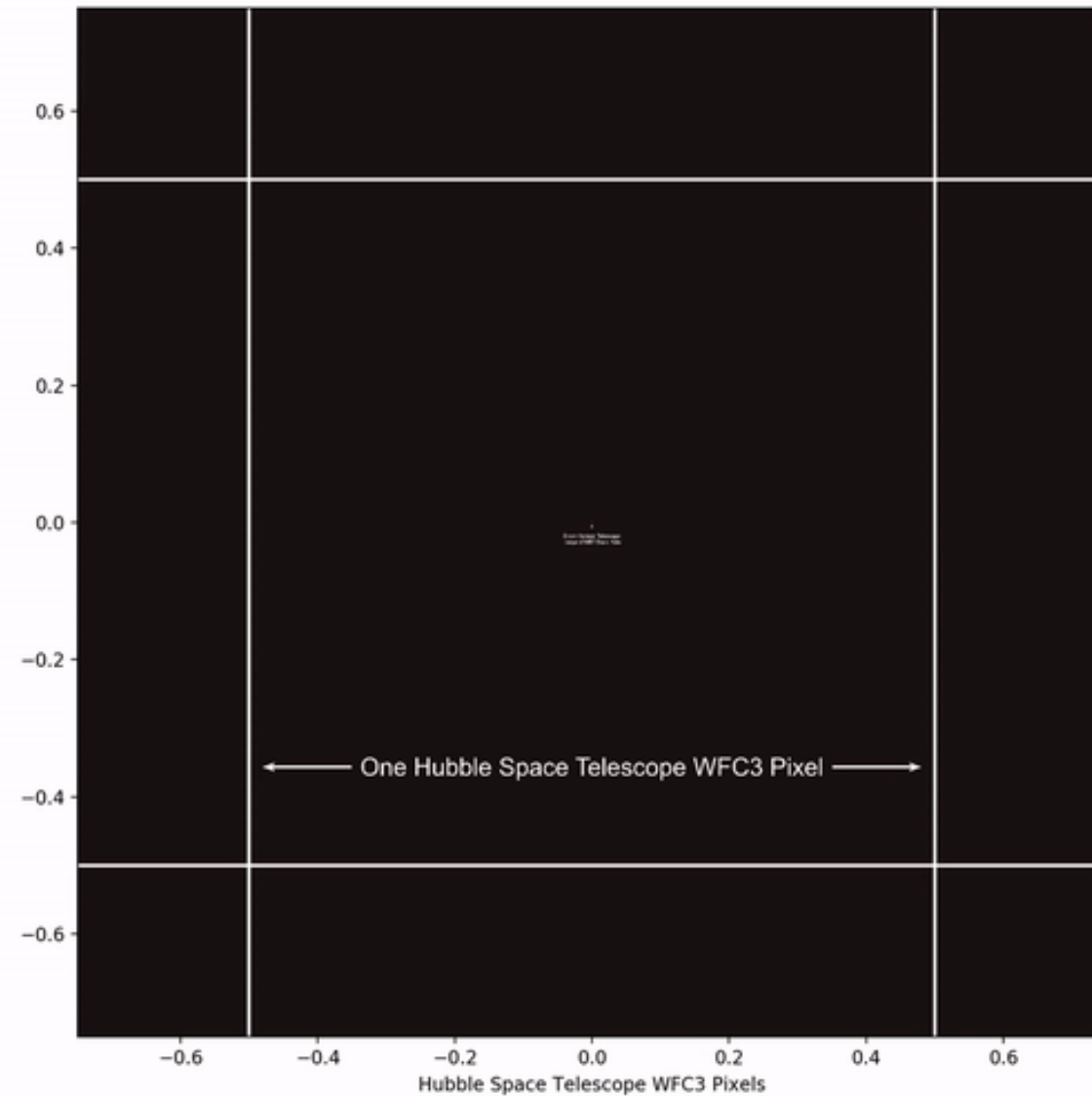
What does a *jet launching* black hole look like on event horizon scales?

The Black Hole Shadow



The largest black hole shadow sizes:
Sgr A*: $50 \mu\text{as} \rightarrow 1.4 \times 10^{-8}$ degrees
M87*: $40 \mu\text{as} \rightarrow 1.1 \times 10^{-8}$ degrees

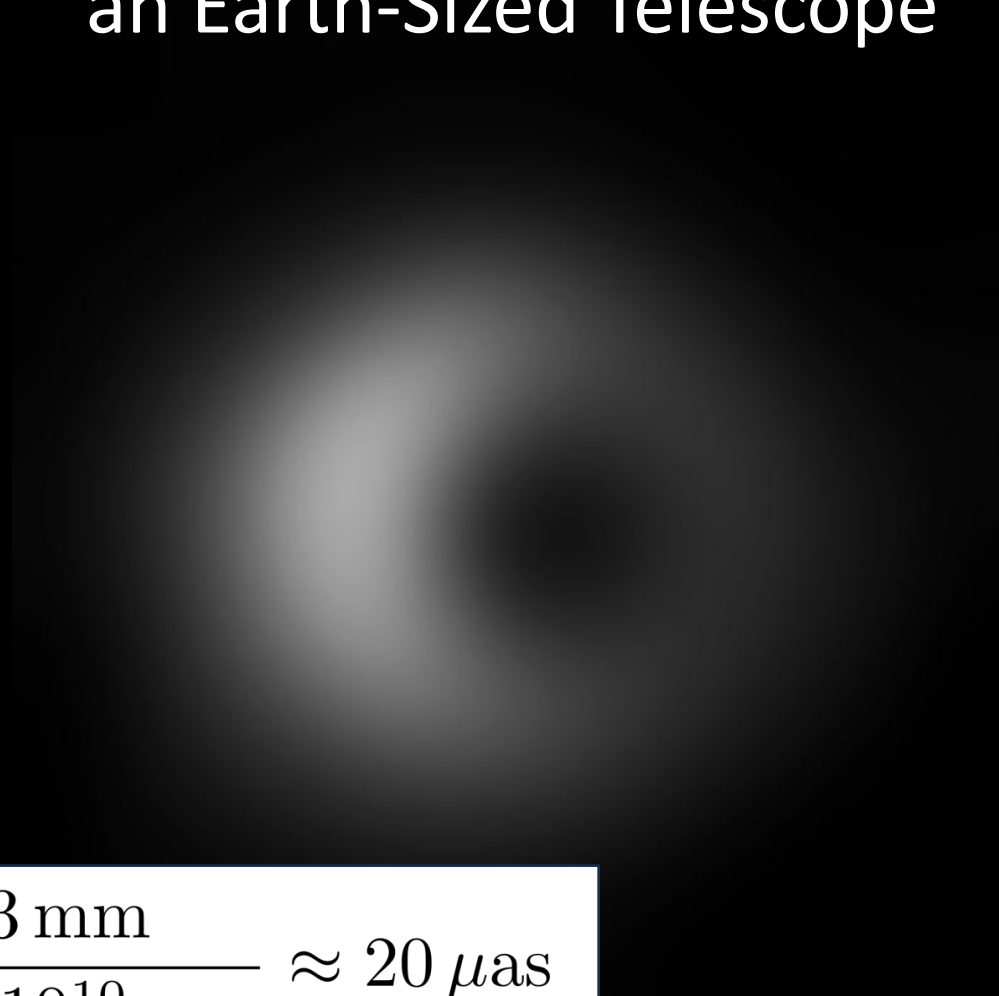
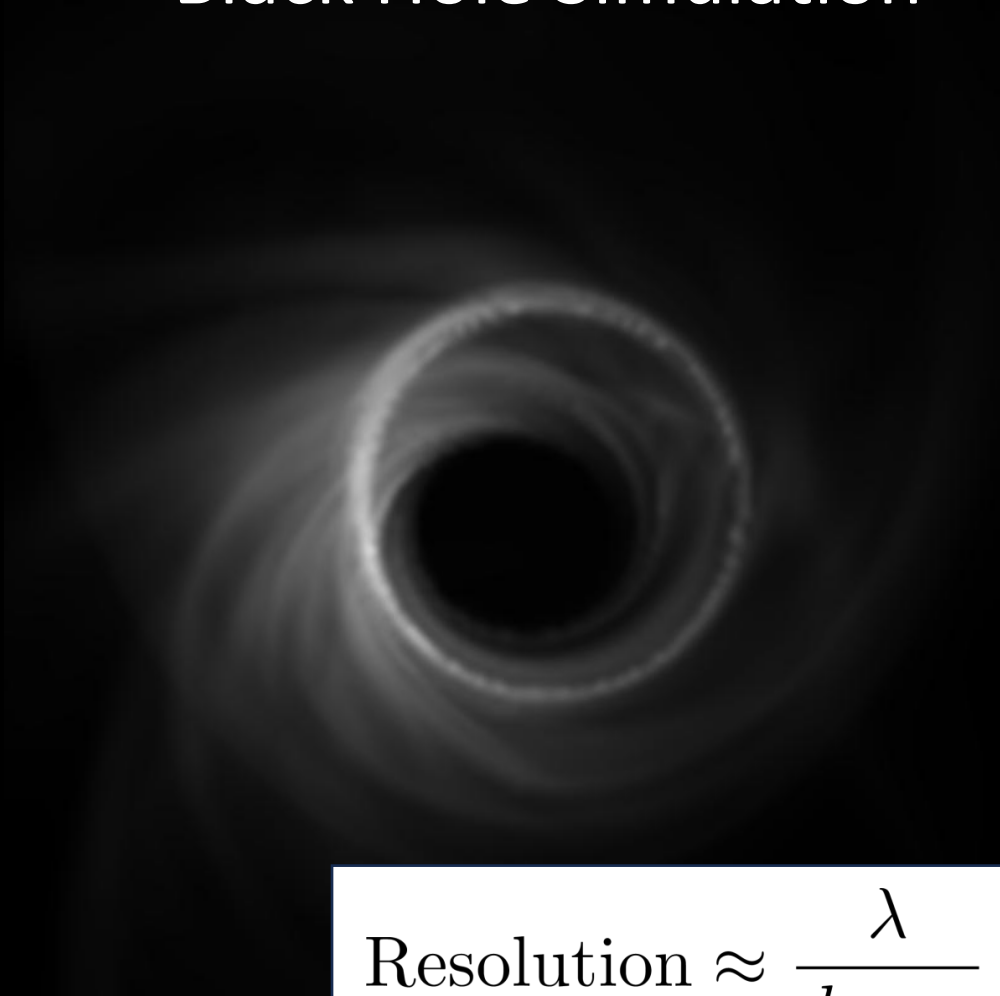
How small is 40 microarcseconds?



Animation credit: Alex Parker

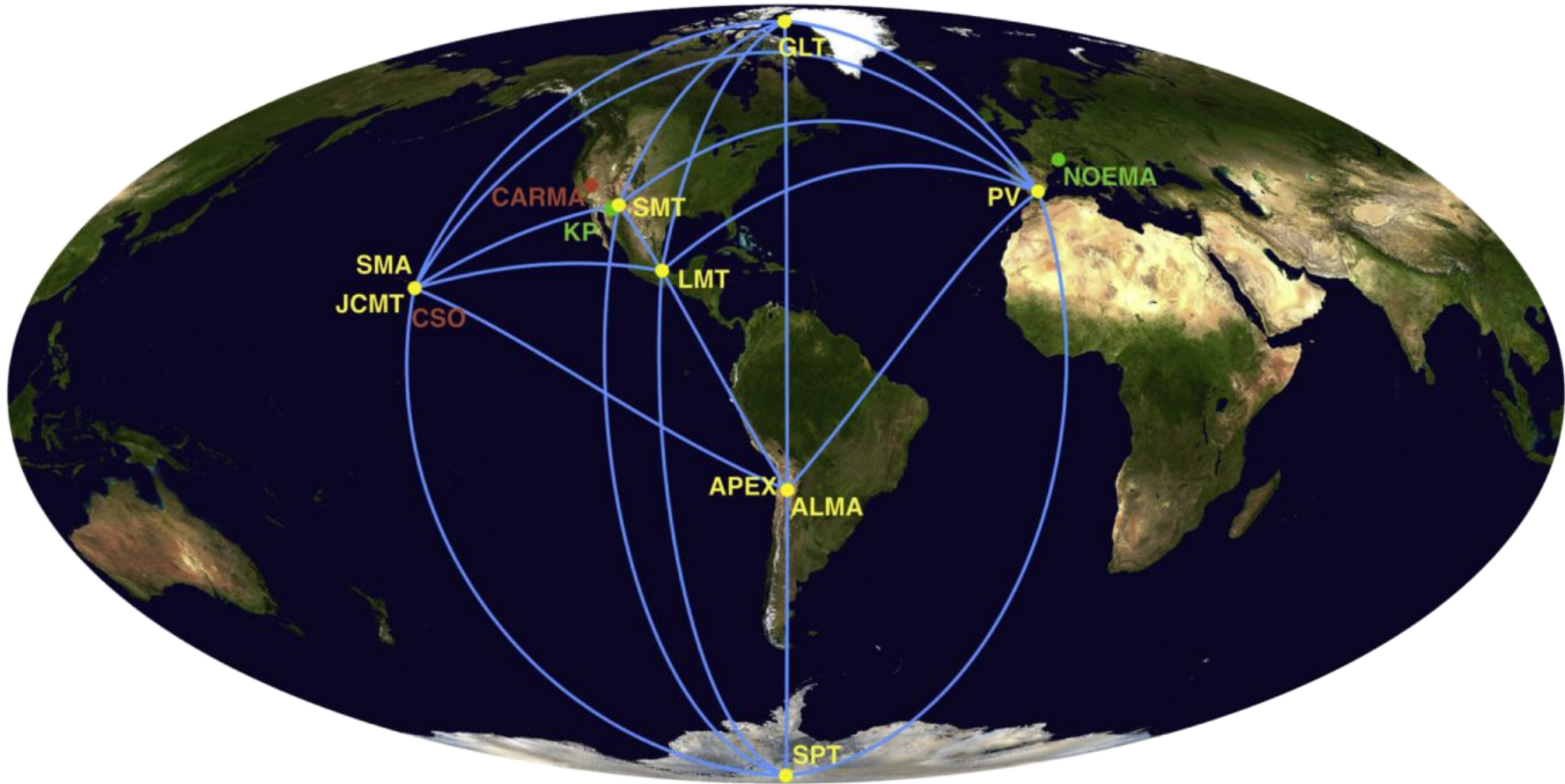
Black Hole Simulation

Simulation viewed through
an Earth-Sized Telescope



$$\text{Resolution} \approx \frac{\lambda}{d_{\text{Earth}}} \approx \frac{1.3 \text{ mm}}{1.3 \times 10^{10} \text{ mm}} \approx 20 \mu\text{as}$$

The Event Horizon Telescope



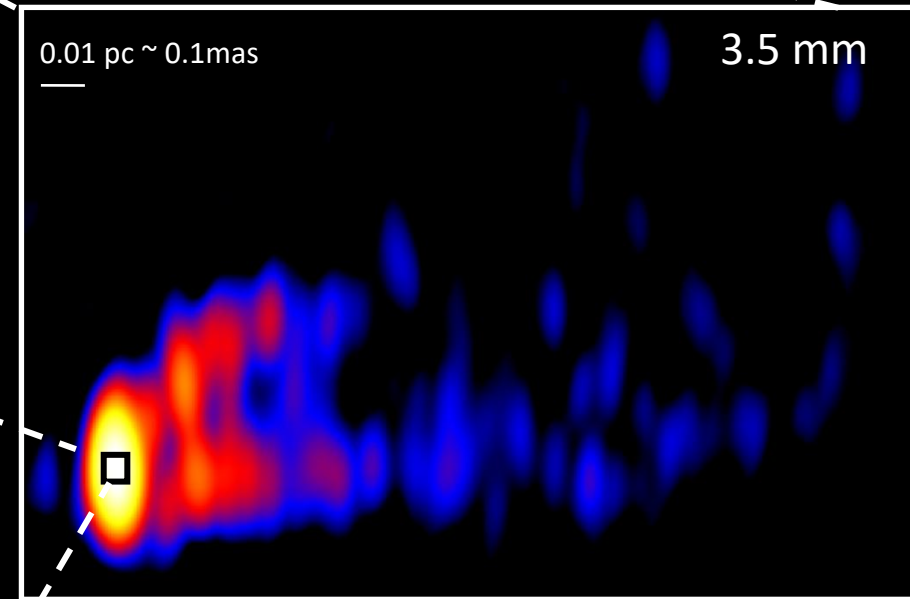
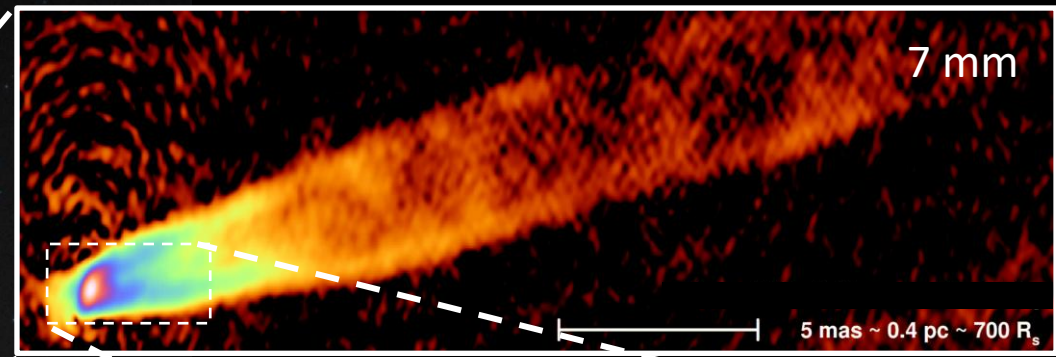
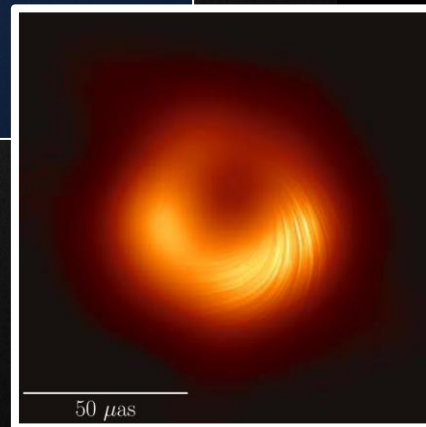
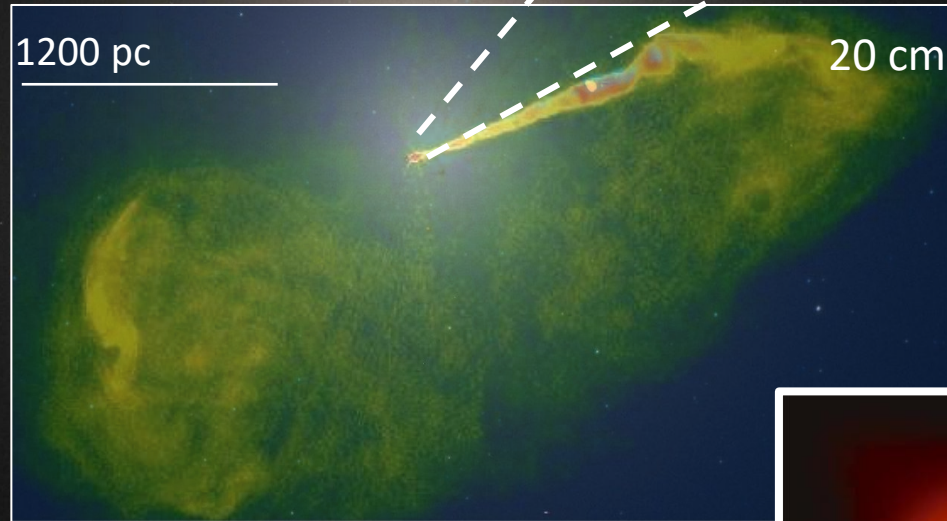
$$\text{Resolution} \approx \frac{\lambda}{d_{\text{Earth}}} \approx \frac{1.3 \text{ mm}}{1.3 \times 10^{10} \text{ mm}} \approx 20 \mu\text{as}$$

M87 & M87*

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

$$D = (16.8 \pm 0.8) \text{Mpc}$$

$$R_s = 2GM/c^2 \approx 64 \text{ AU}$$



Sgr A*

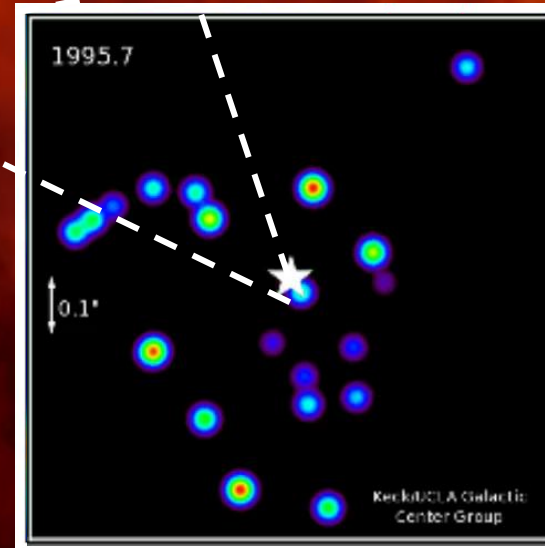
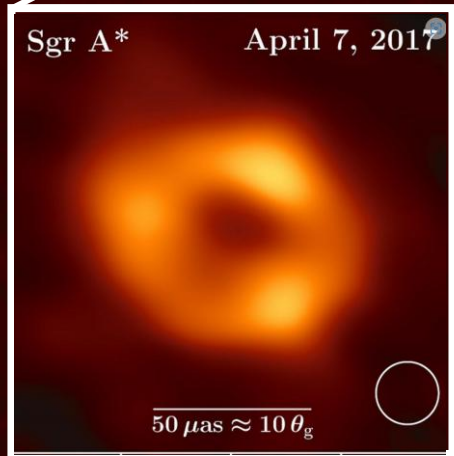
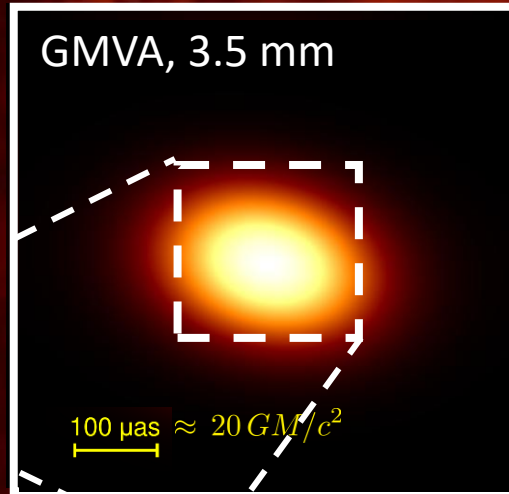
JVLA, 6 cm

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

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

Gravity Collaboration, 2018

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



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

Image credits: K.Y. Lo (VLA), UCLA Galactic Center Group (Keck),
Issaoun+ 2019, 2021 (GMVA+ALMA 3mm image), EHT (1.3mm)

International Collaboration Drives the EHT



300+ members, **60+** institutes, **20+** countries, **5** continents

The EHT:

Many antennas + lots of software +
international teamwork = one
computational telescope

Outline

1. How did the EHT make images of black holes?
2. What have we learned from EHT images?
3. Next Steps in EHT capabilities and new imaging methods

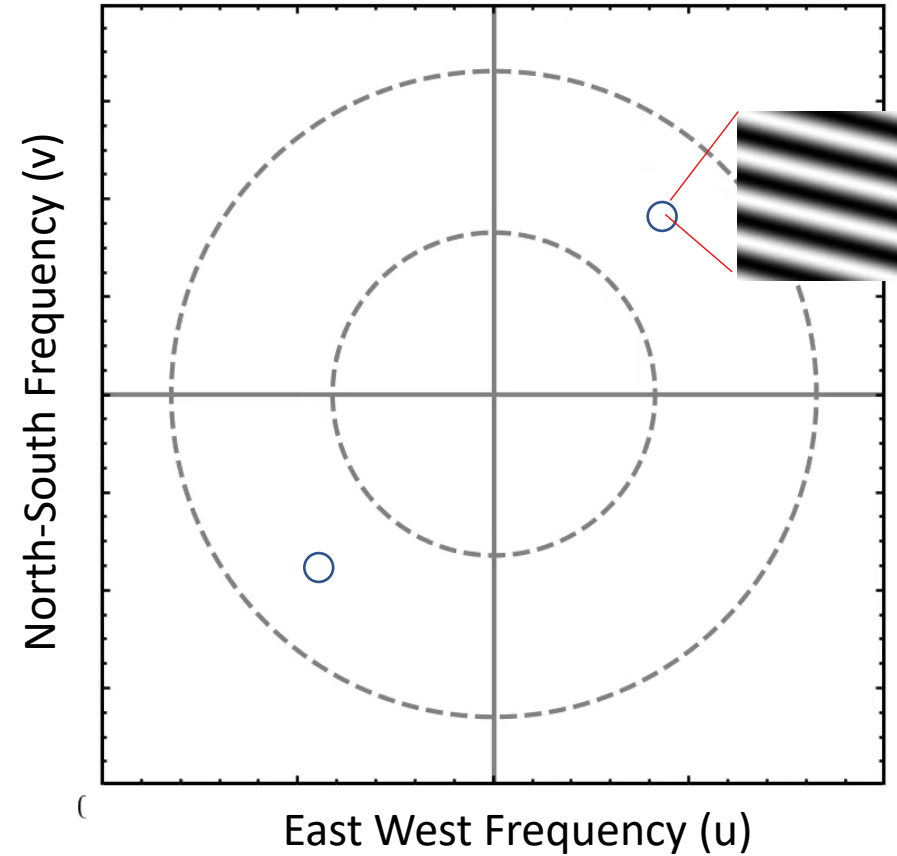
How do we obtain black hole images with the EHT?

EHT M87 Papers I-VI, *ApJL* 2019

EHT M87 Papers VII-IX, *ApJL* 2021, 2024 (Polarization)

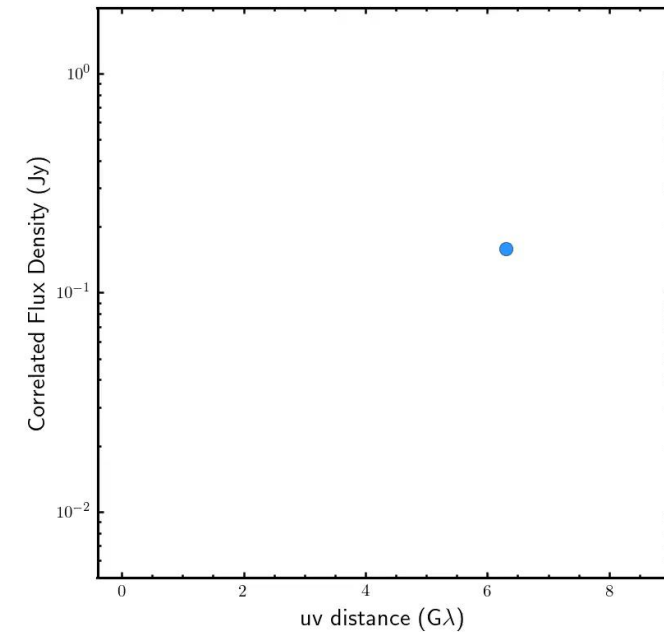
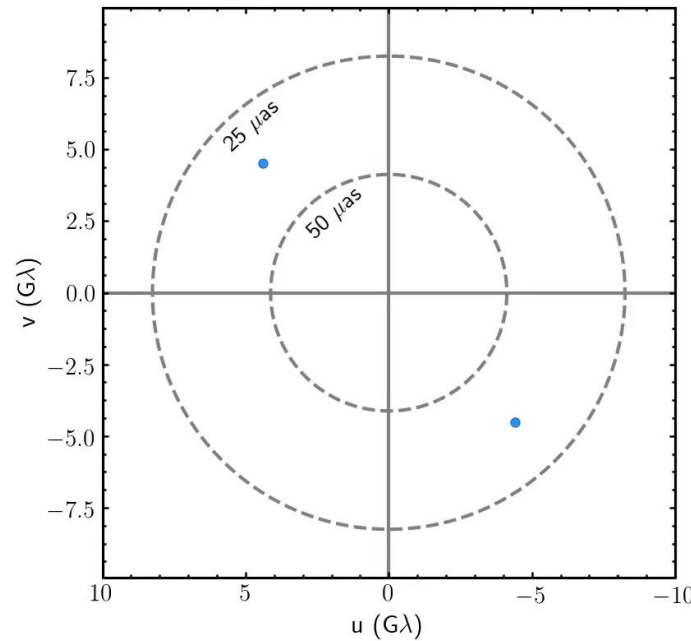
EHT Sgr A* Papers I-VIII, *ApJL* 2022, 2024

Very Long Baseline Interferometry (VLBI)



Every projected **baseline** between two telescopes provides **one Fourier component** of the image

Very Long Baseline Interferometry (VLBI)



Every projected **baseline** between two telescopes provides **one Fourier component** of the image
Earth's rotation helps **fill in** the Fourier plane

EHT: Array

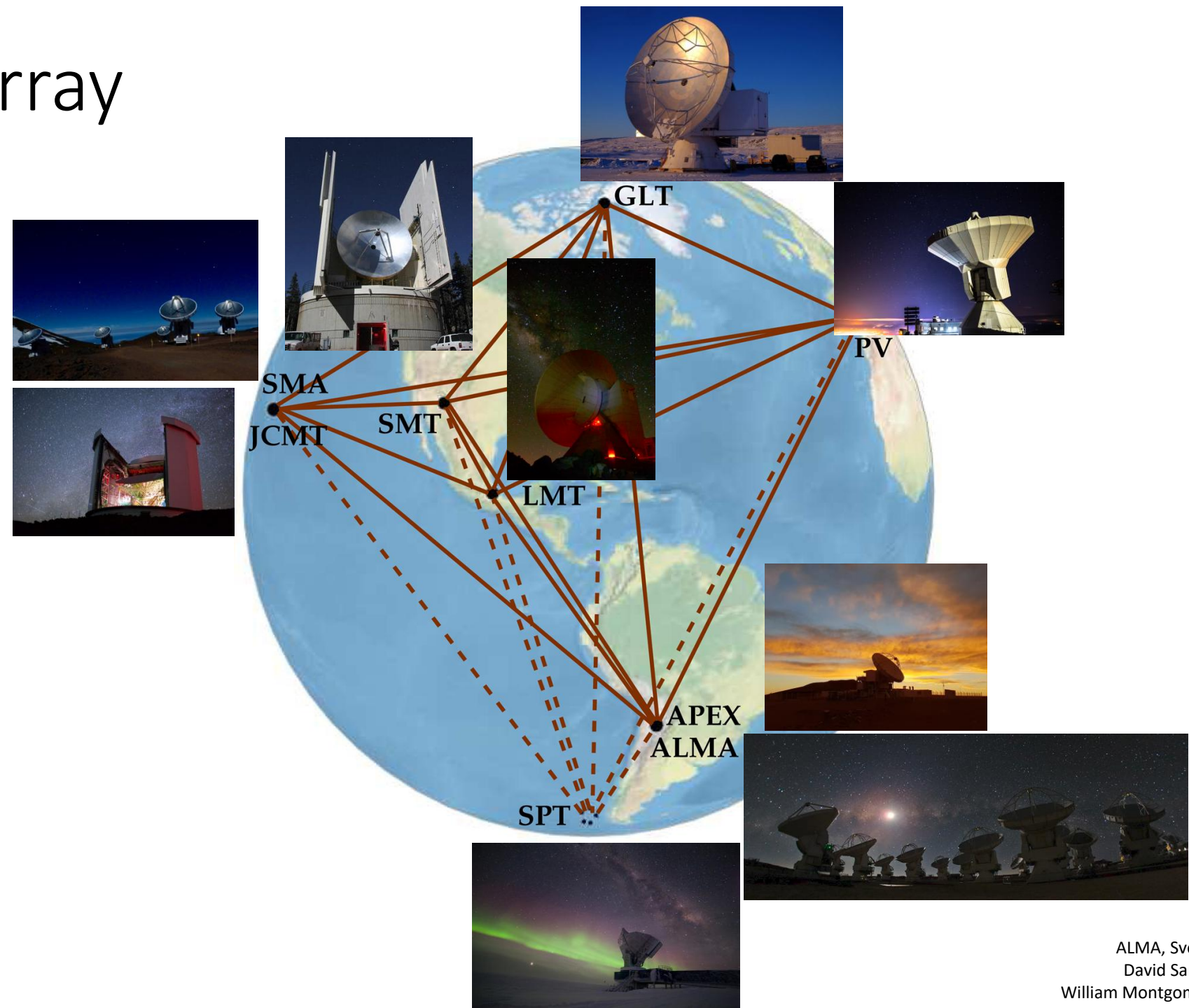


Photo Credits: EHTC 2024 I
ALMA, Sven Dornbusch, Junhan Kim, Helge Rottmann,
David Sanchez, Daniel Michalik, Jonathan Weintroub,
William Montgomerie, Tom Folkers, ESO, IRAM, Nimesh Patel

EHT Observations

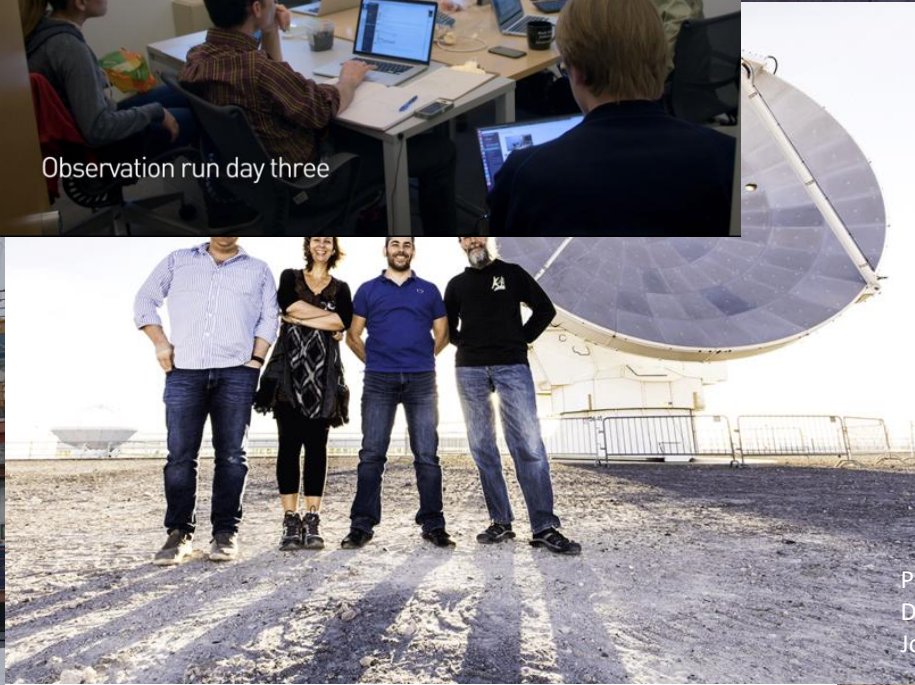
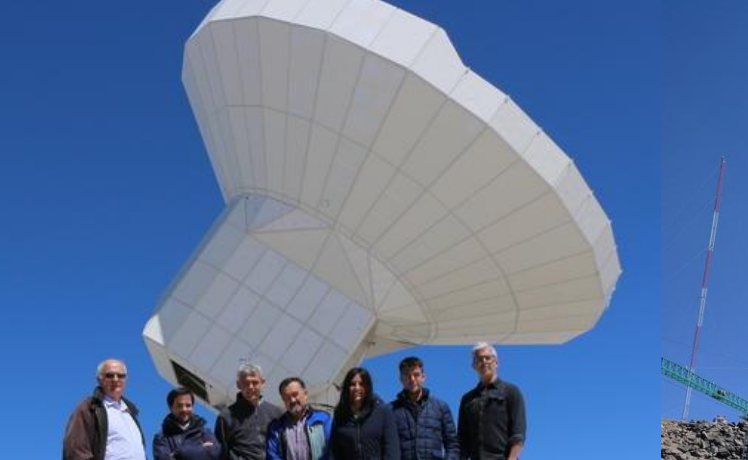
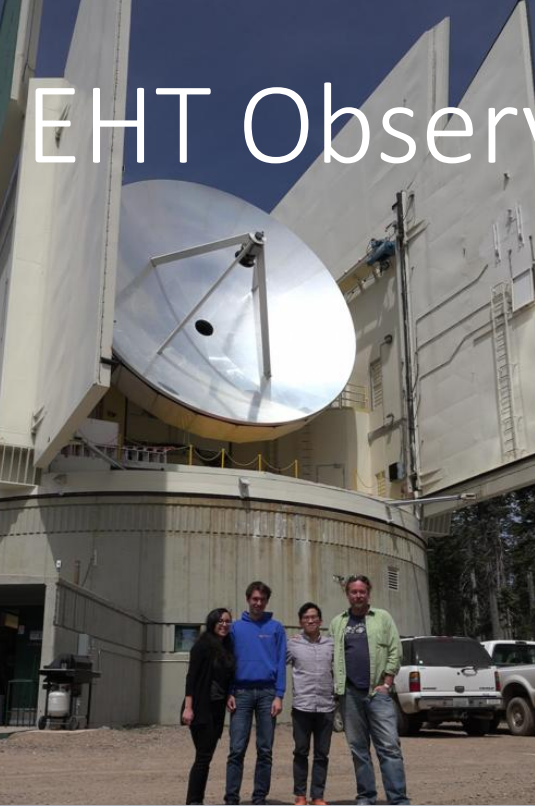
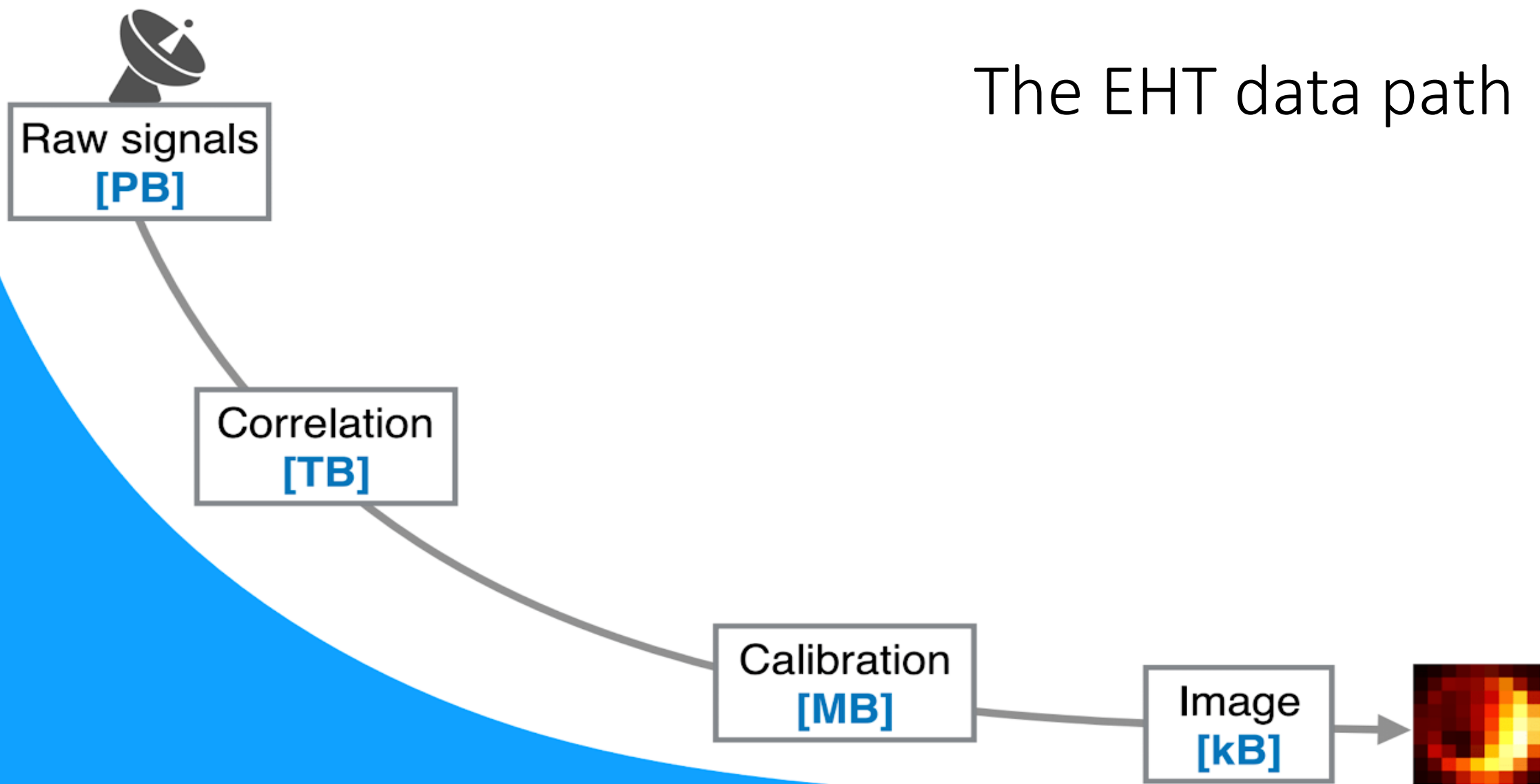


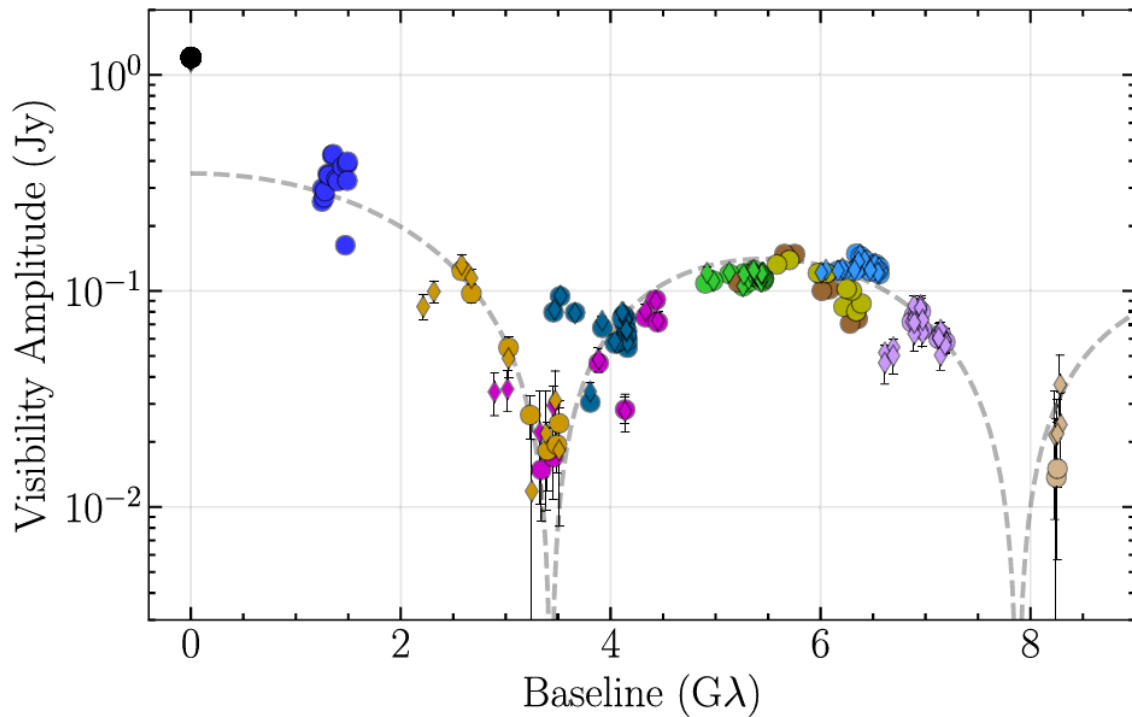
Photo credits:
David Michalik, Junhan Kim, Salvaor Sanchez, Helge Rottman,
Jonathan Weintroub, Gopal Narayanan

The EHT data path

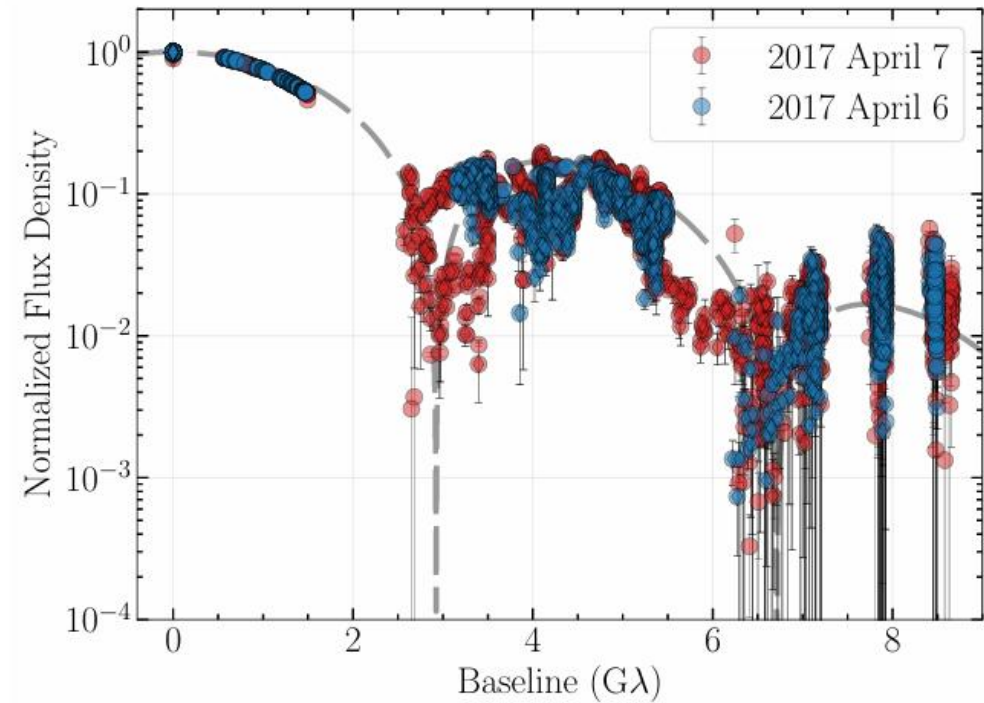


EHT Data Suggests Ring Structure

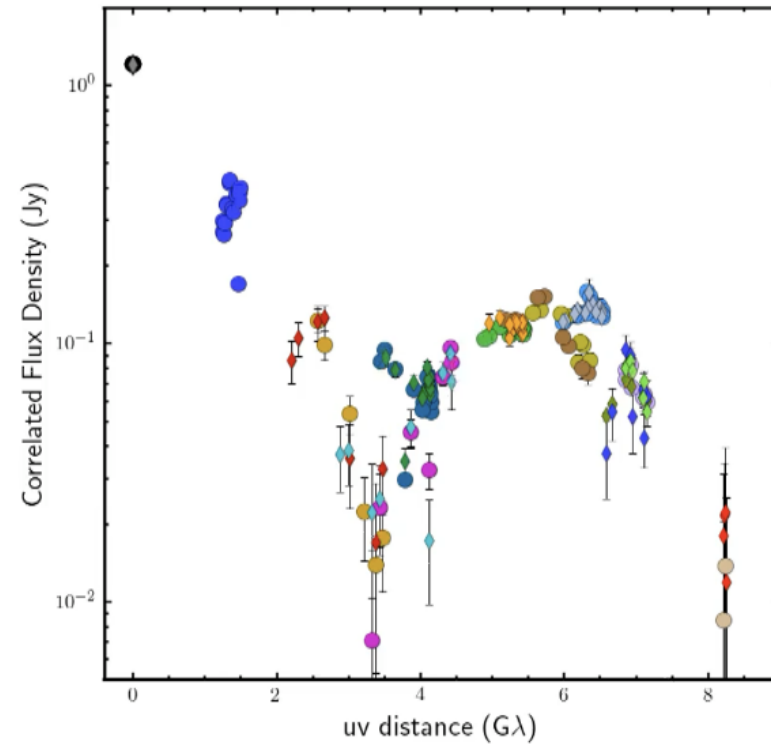
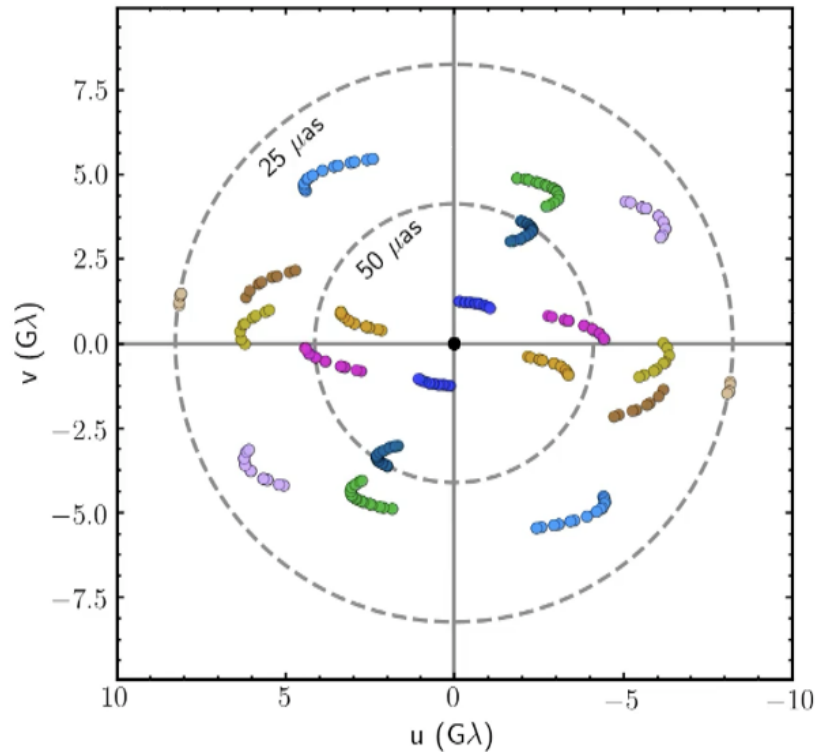
M87*



Sgr A*

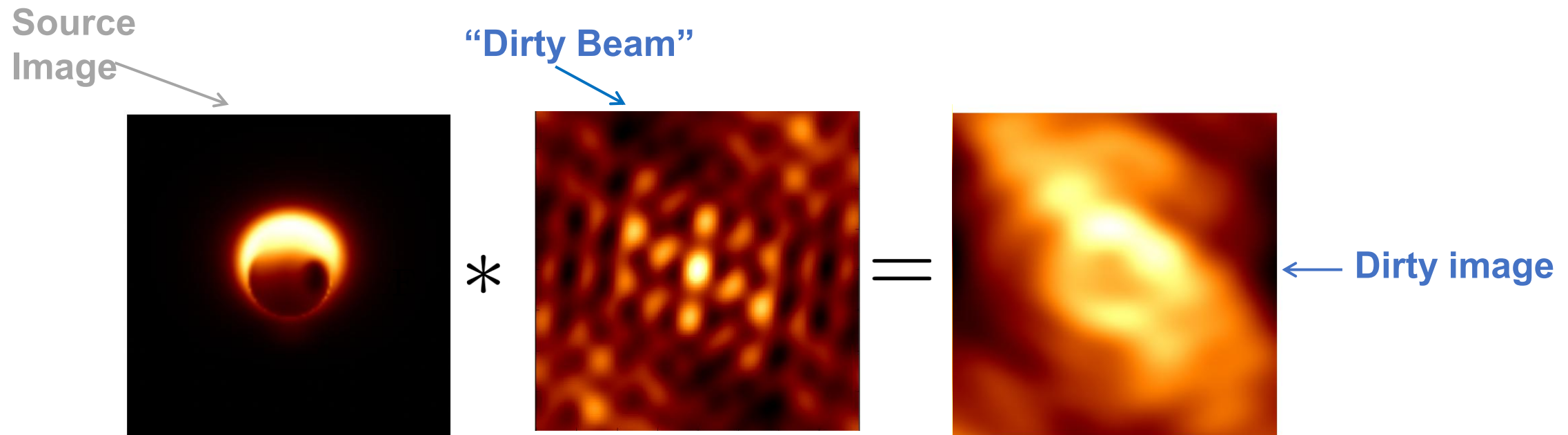


Why imaging is hard: Our Data are *Sparse*

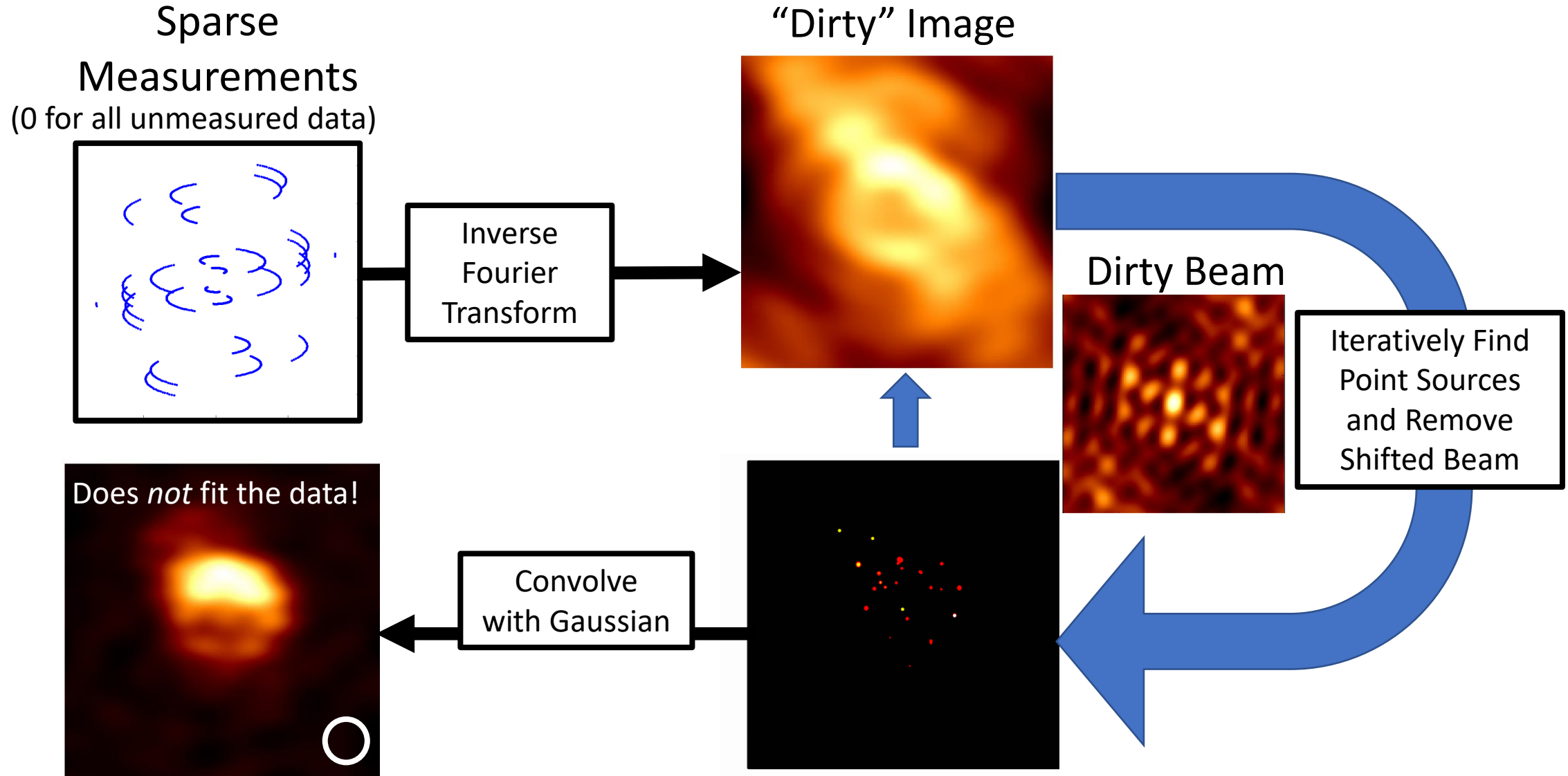


EHT coverage is **sparse**: inversion of image from the data is highly unconstrained

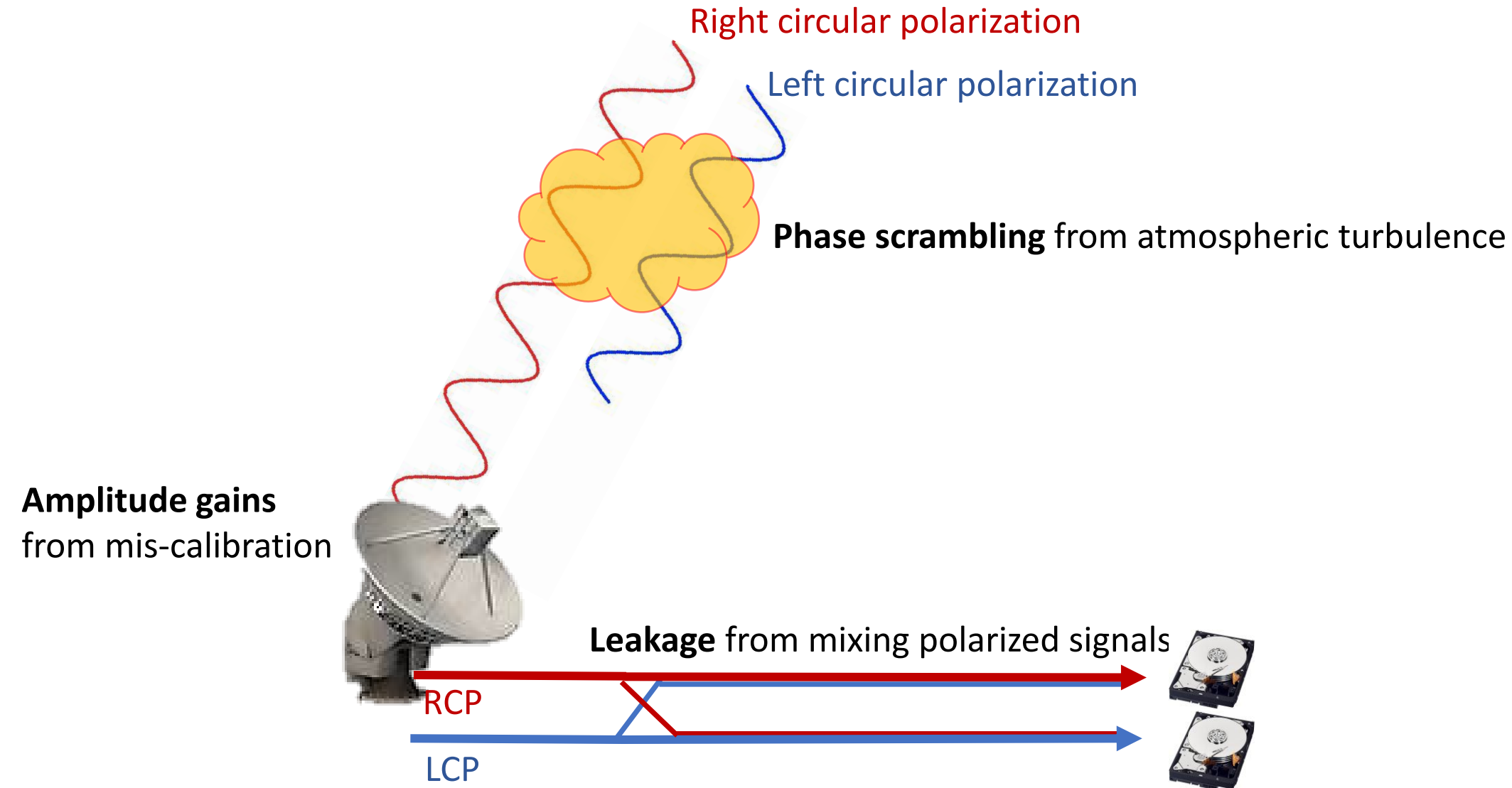
Dealing with Sparsity: Deconvolution



Traditional Approach: CLEAN

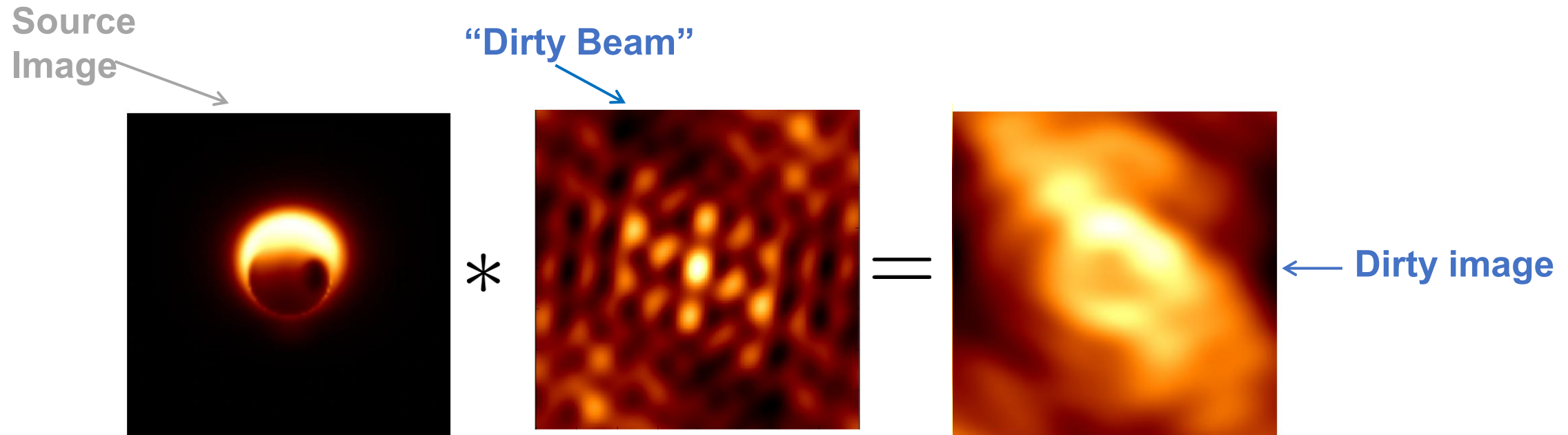


Why imaging is hard: Our Data are *Corrupted*



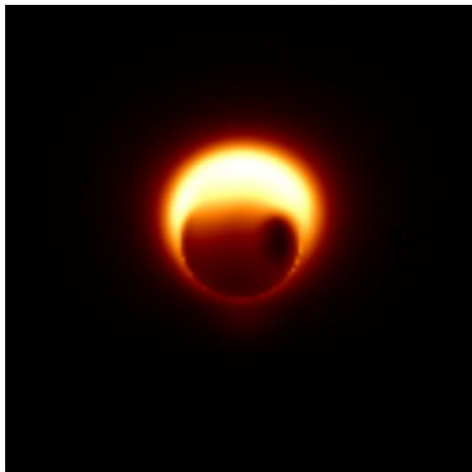
Data at each station are corrupted by unknown **gain and leakage** systematics

The importance of phase

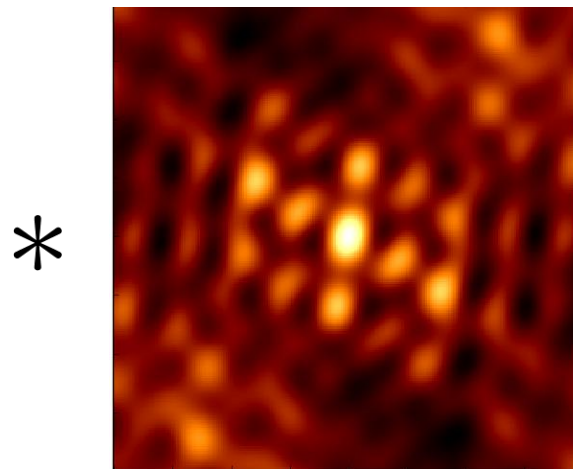


The importance of phase

Source
Image

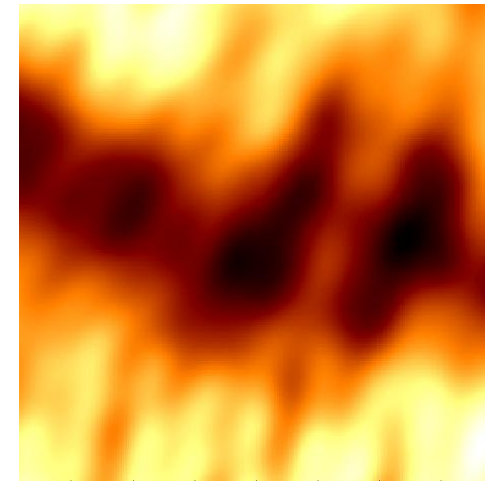


“Dirty Beam”



*

≠



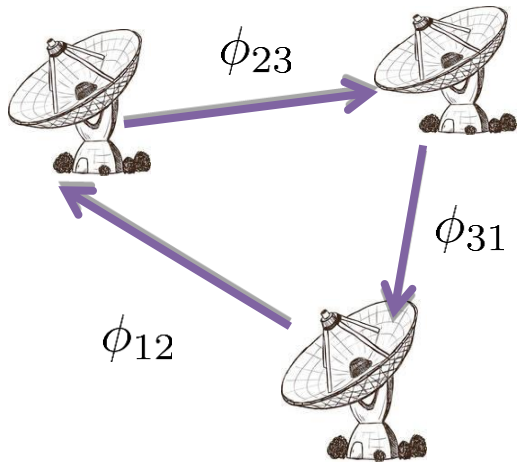
← Dirty image
with
*uncalibrated
phases*

Closure Quantities

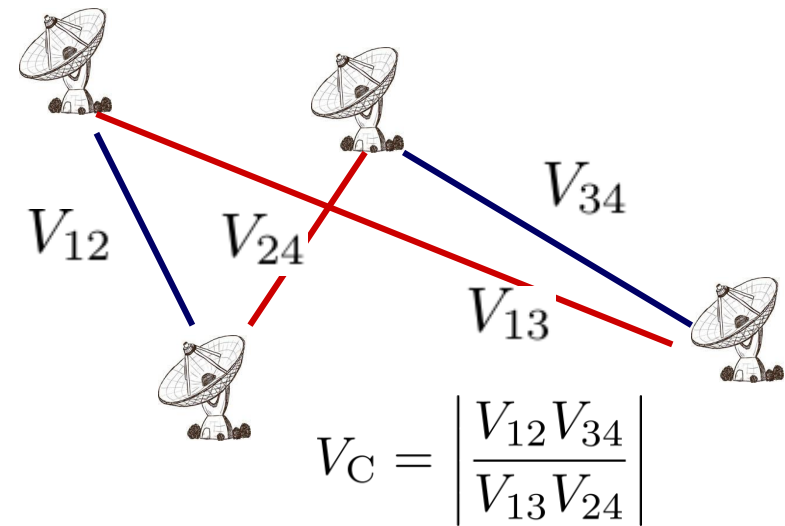
- Visibilities are corrupted by **station-based** gain errors

$$V_{\text{measured}} = G_1 e^{i\phi_1} G_2 e^{-i\phi_2} \mathcal{V}_{\text{true}}$$

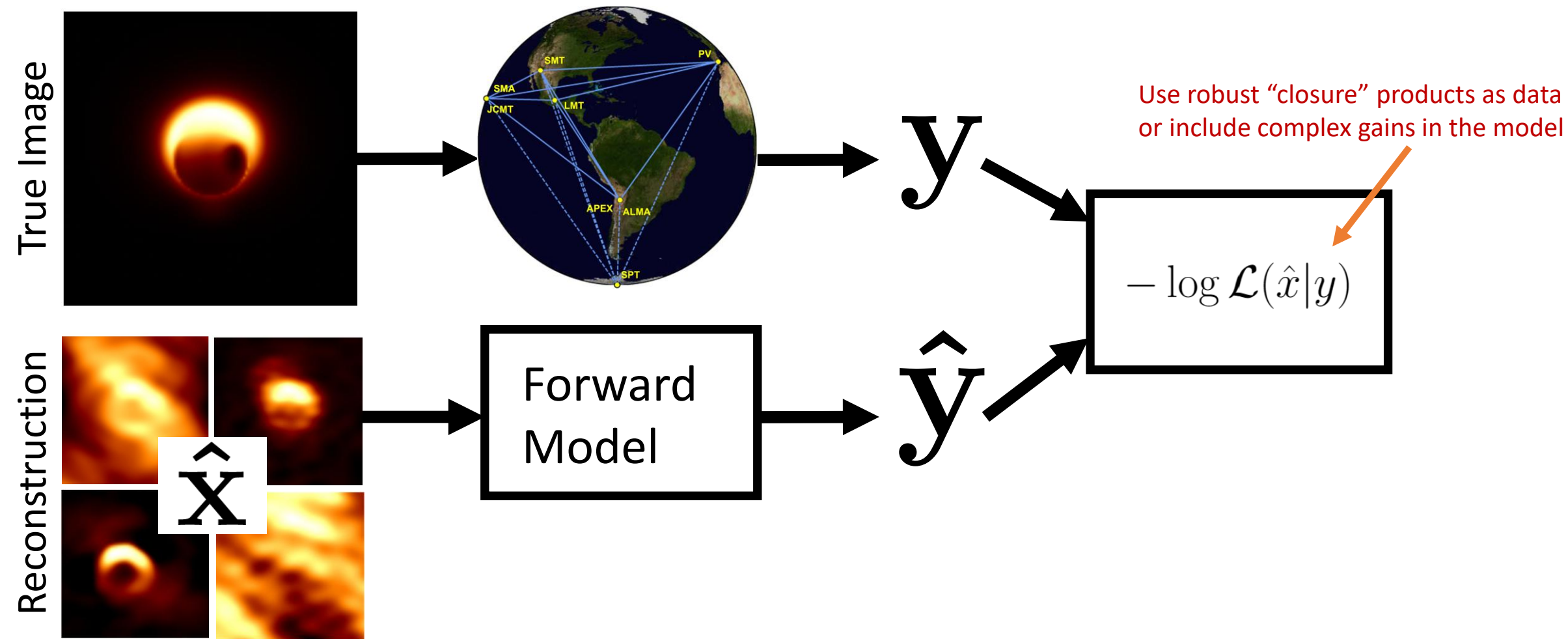
- **Closure phases** are invariant to station-based phase errors and **Closure amplitudes** are invariant to amplitude gains



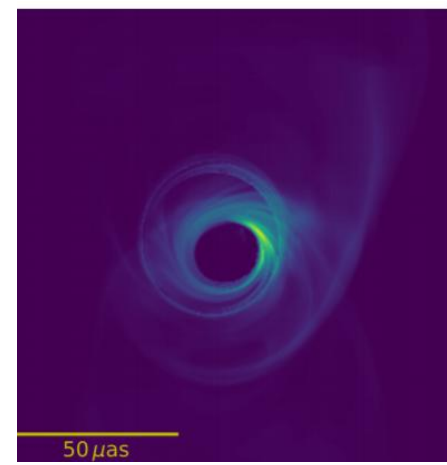
$$\psi_C = \phi_{12} + \phi_{23} + \phi_{31}$$



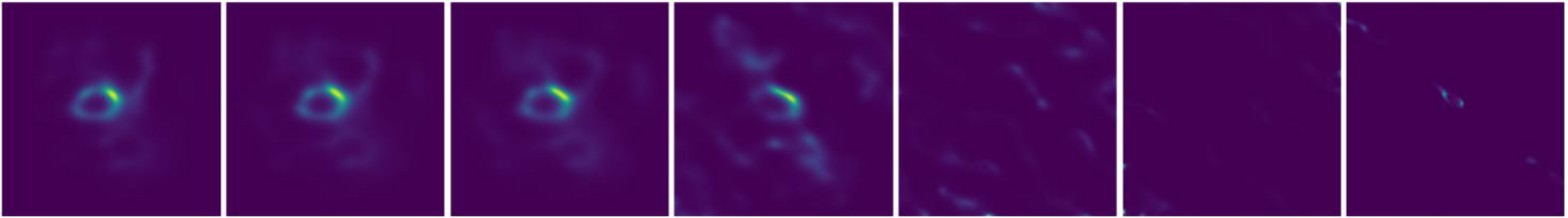
Forward Modeling for the Image



Imaging with robust closure observables

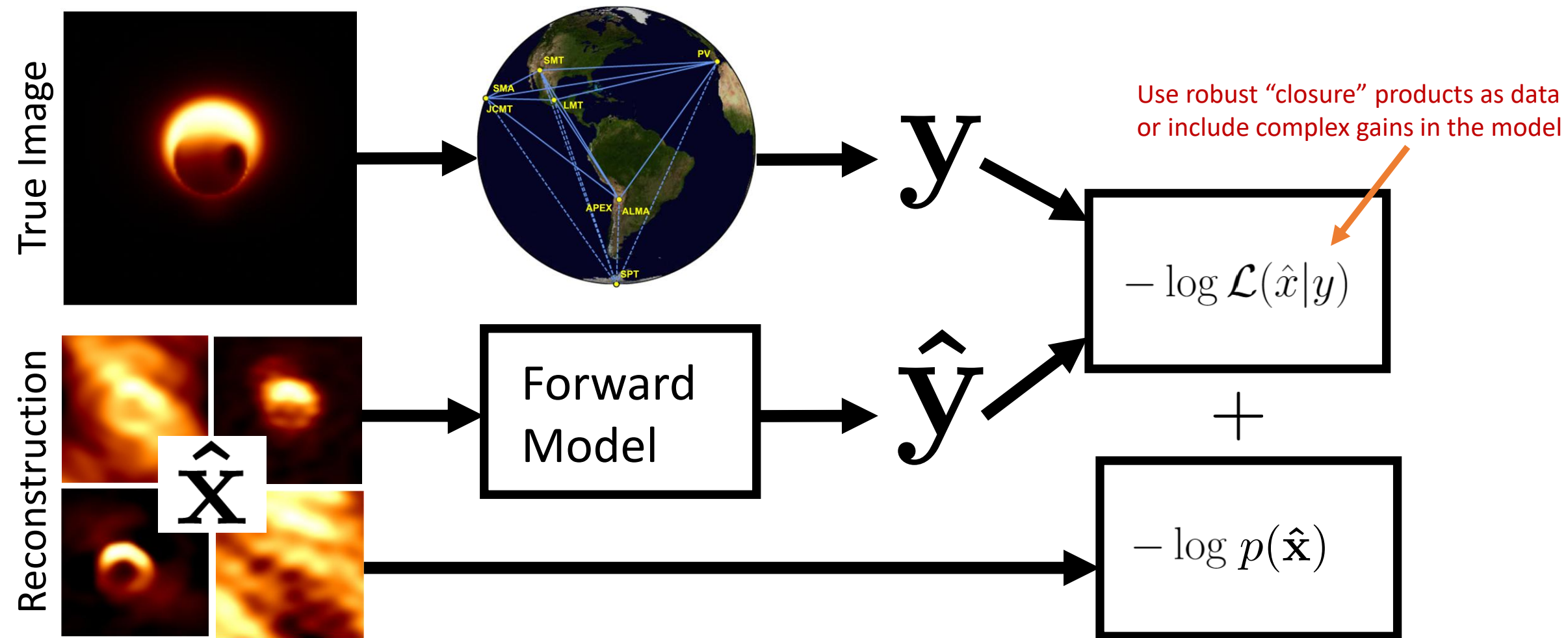


Amp
+ Cl Phase

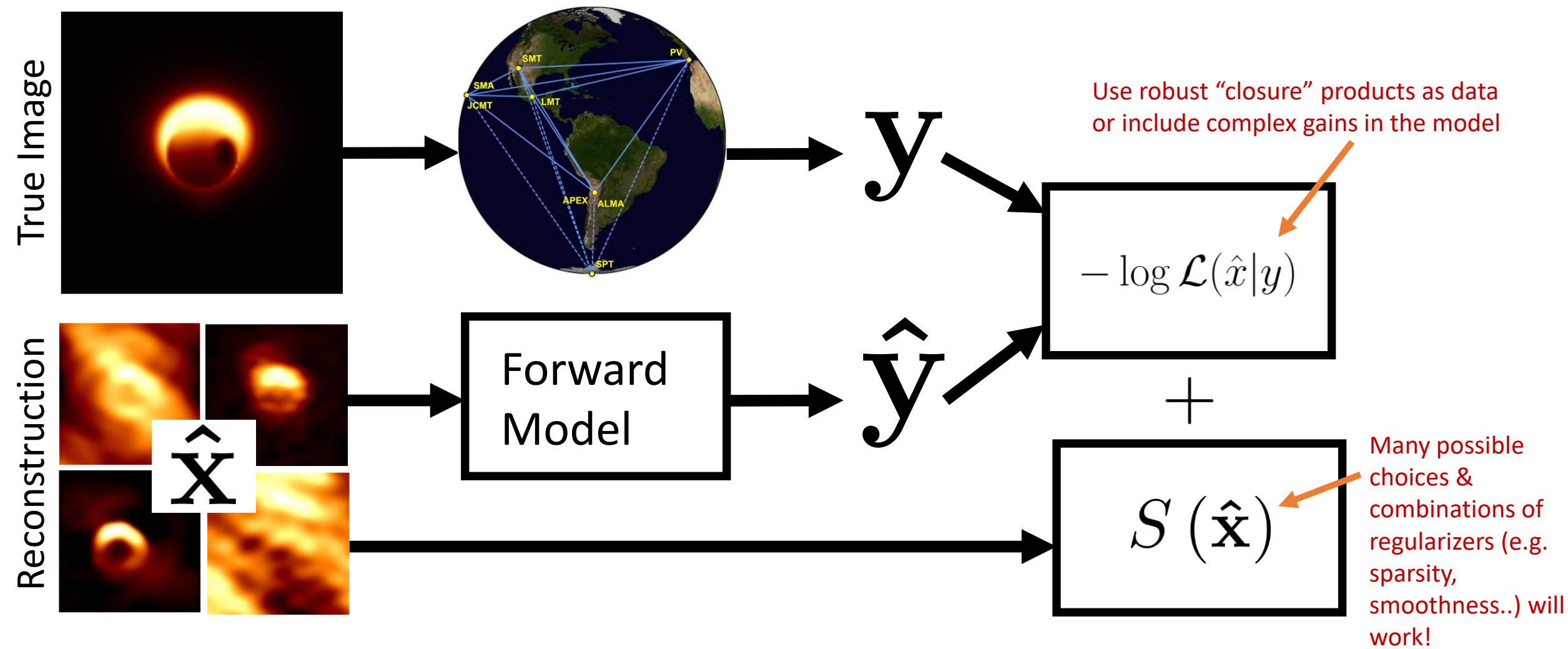


Increasing Gain Calibration Error

“Bayesian” Imaging



Regularized Maximum Likelihood (RML)



Regularizers and hyperparameter surveys

Sparsity (l1):

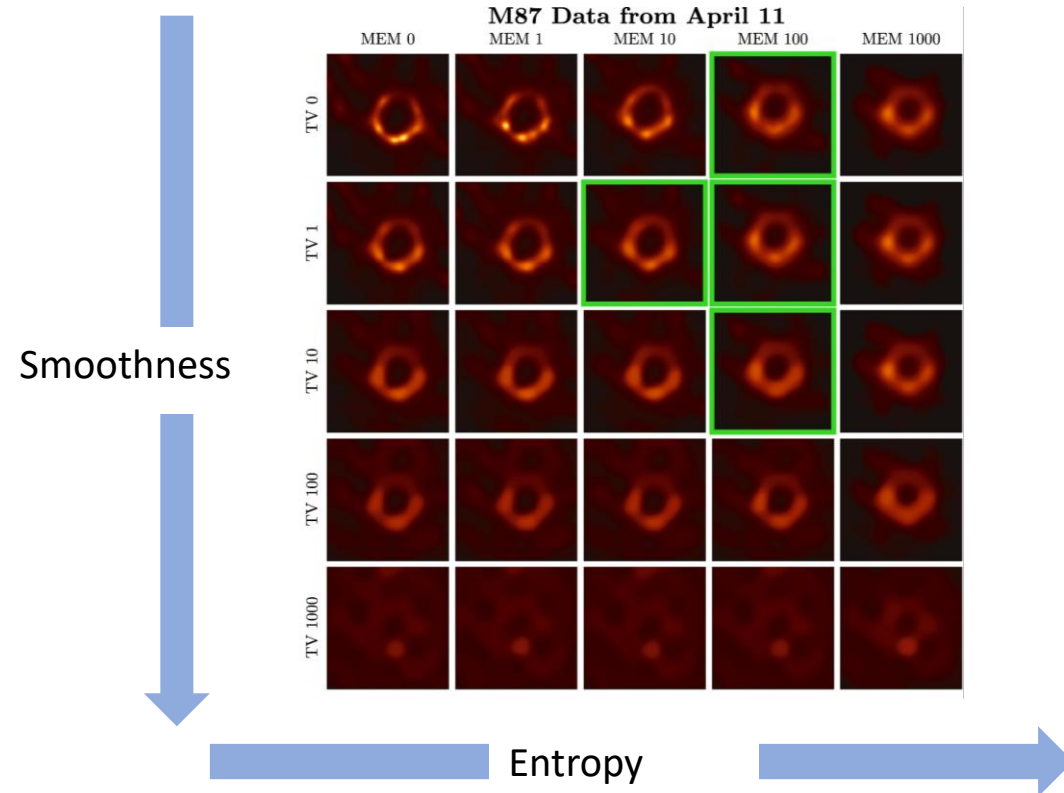
Favors the image to be mostly empty space

Smoothness (TV):

Favors an image that varies slowly over small spatial scales

Maximum Entropy (MEM):

Favors compatibility with flat brightness or a specified image



The **eht-imaging** software library

- python toolkit for **analyzing, simulating, and imaging** interferometric data
- A flexible framework for developing new tools:
 - dynamical imaging (Johnson+ 2017)
 - **multi-frequency imaging (Chael+ 2023a)**
 - geometric modeling (Roelofs+ 2023)
- Uses:
 - All EHT results to date
 - Next-generation EHT design
 - Imaging & analysis from VLBA, GMVA, ALMA, RadioAstron...

achael/**eht-imaging**

Imaging, analysis, and simulation software for radio interferometry



26

Contributors

11

Used by

5k

Stars

489

Forks



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

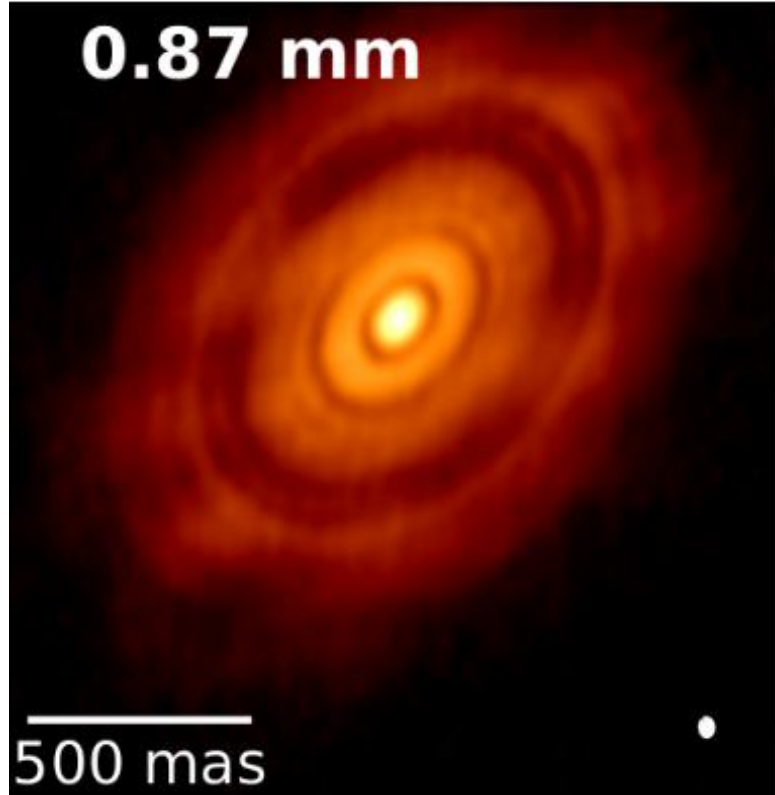
```
pip install ehtim
```

Chael+ 2016, 2018a, 2023a

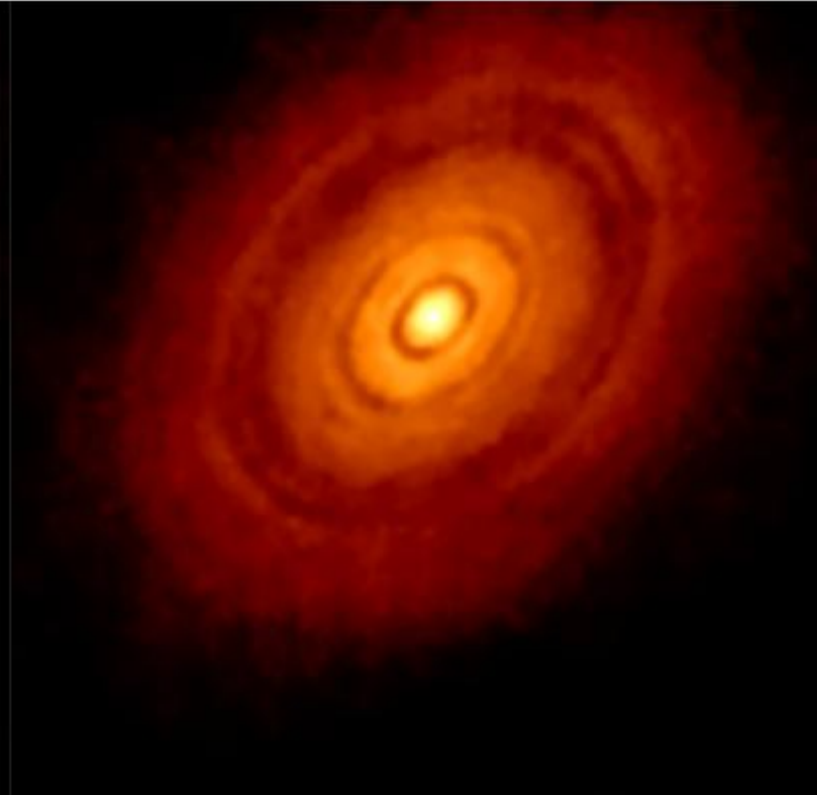
eht-imaging beyond the EHT

HL Tau with ALMA

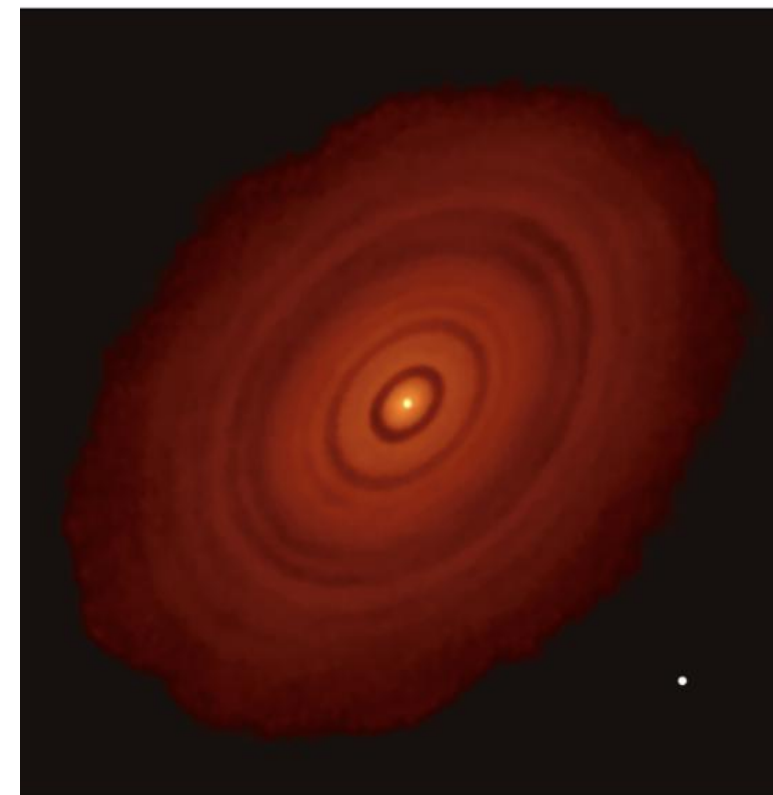
Original CLEAN image



With eht-imaging



With eht-imaging (multifrequency)



How do we verify what we are
reconstructing is real?

Paper IV coordinators



Michael Johnson



Kazu Akiyama

First M87 Event Horizon Telescope Results. IV. Imaging the Central Supermassive Black Hole

The Event Horizon Telescope Collaboration
(See the end matter for the full list of authors.)

Received 2019 February 11; revised 2019 March 5; accepted 2019 March 6; published 2019 April 10

Abstract

We present the first Event Horizon Telescope (EHT) images of M87, using observations from April 2017 at 1.3 mm wavelength. These images show a prominent ring with a diameter of $\sim 40 \mu\text{as}$, consistent with the size and shape of the lensed photon orbit encircling the “shadow” of a supermassive black hole. The ring is persistent across four observing nights and shows enhanced brightness in the south. To assess the reliability of these results, we implemented a two-stage imaging procedure. In the first stage, four teams, each blind to the others’ work, produced images of M87 using both an established method (CLEAN) and a newer technique (regularized maximum likelihood). This stage allowed us to avoid shared human bias and to assess common features among independent reconstructions. In the second stage, we reconstructed synthetic data from a large survey of imaging parameters and then compared the results with the corresponding ground truth images. This stage allowed us to select parameters objectively to use when reconstructing images of M87. Across all tests in both stages, the ring diameter and asymmetry remained stable, insensitive to the choice of imaging technique. We describe the EHT imaging procedures, the primary image features in M87, and the dependence of these features on imaging assumptions.

Key words: black hole physics – galaxies: individual (M87) – galaxies: jets – techniques: high angular resolution – techniques: image processing – techniques: interferometric

+ many, many contributions from
across the EHT collaboration



José L. Gómez

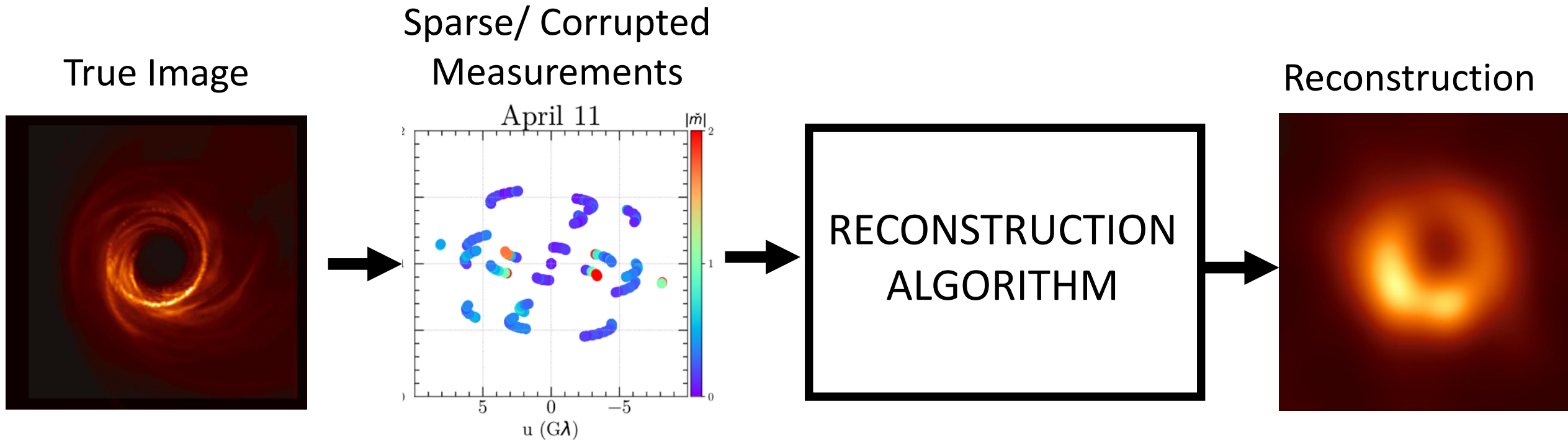


Katie Bouman



Andrew Chael

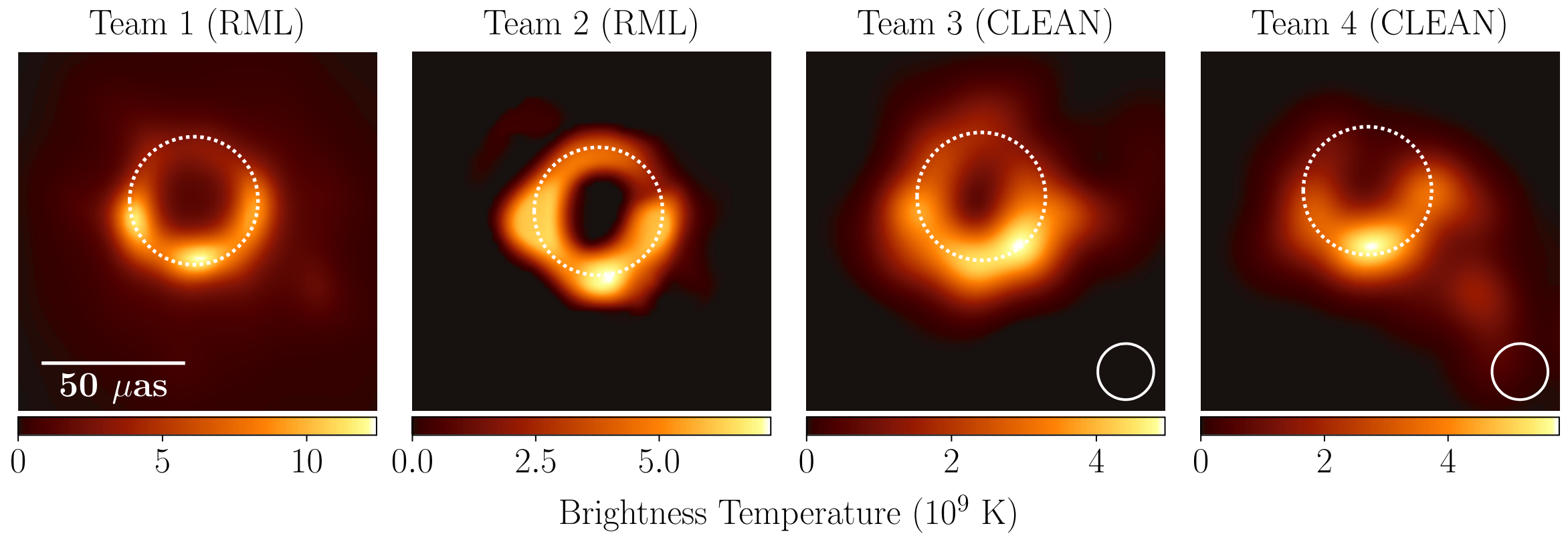
We can't rely on one reconstruction algorithm



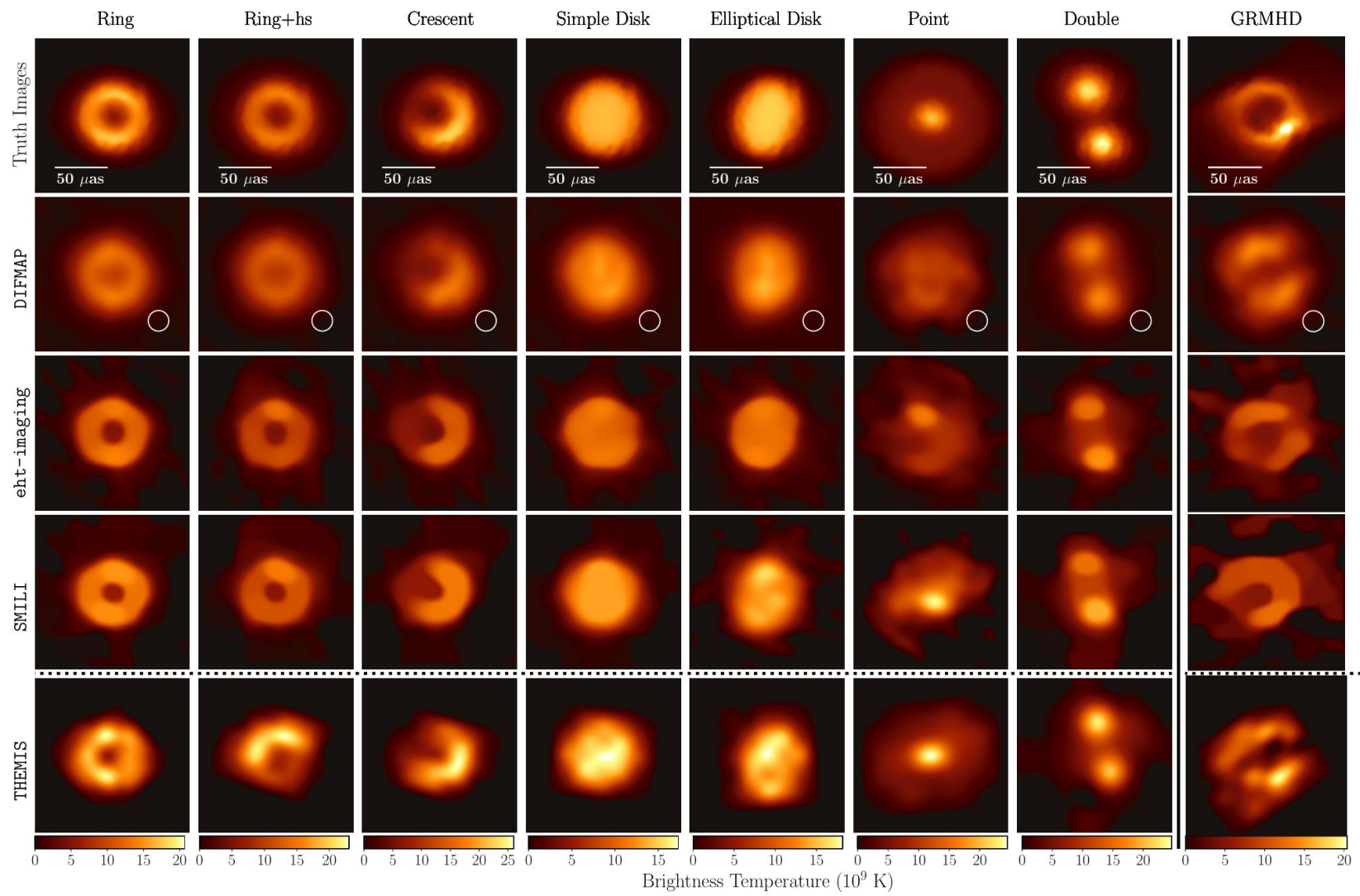
We **test and compare** many reconstruction methods to determine the most reliable image and image features:

- **CLEAN-based**: standard and efficient, but can have difficulties on very sparse data
 - Difmap (Shepherd 1997), LPCAL/GPCAL (Park+ 2021)
- **Regularized Maximum Likelihood / Gradient Descent**: fast and flexible, but lots of hyperparameters
 - eht-imaging (Chael+ 2016, 2018), SMILI (Akiyama+ 2017)
- **Bayesian MCMC posterior exploration**: fully characterizes uncertainty, but more expensive
 - Themis (Broderick+ 21), DMC (Pesce+ 21), Comrade (Tiede 2022)

Stage 1: Blind Imaging

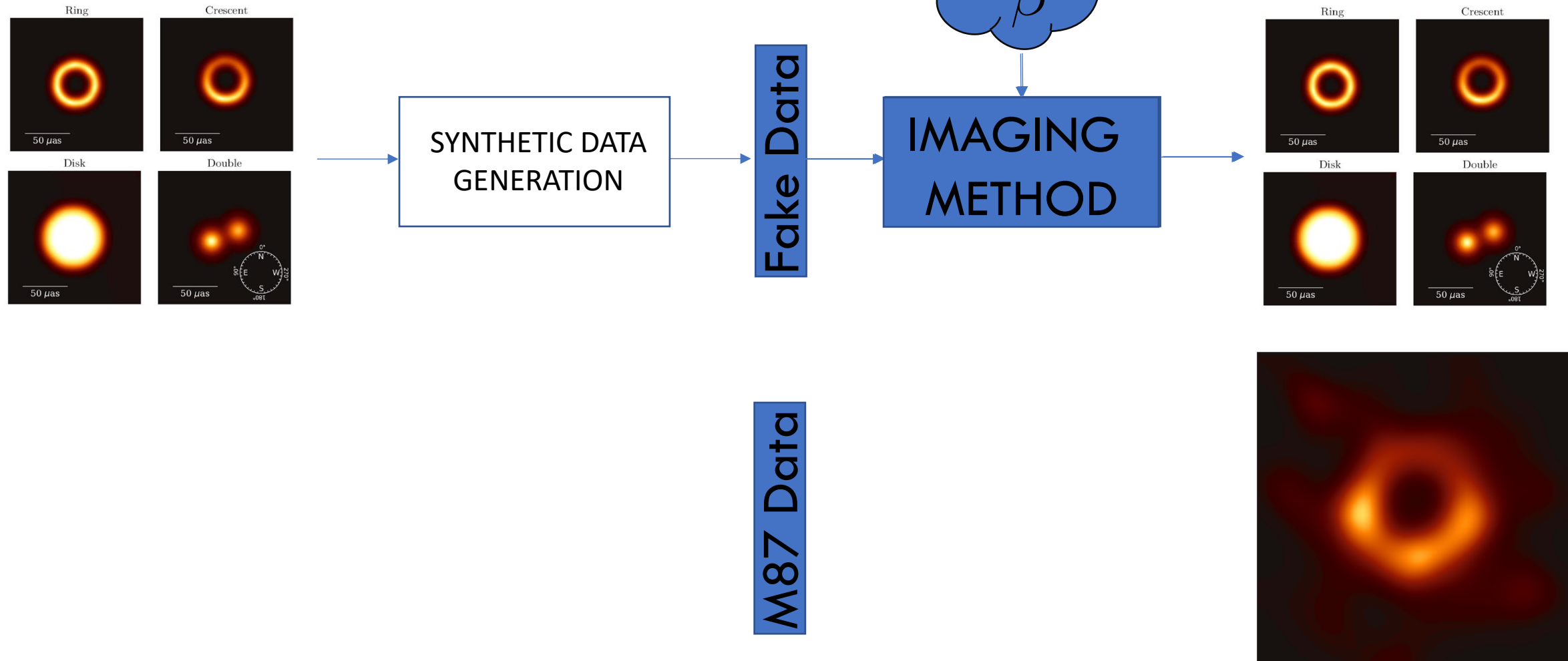


Stage 2: Testing our methods with synthetic data



Stage 3:

Test 30,000+ hyperparameter sets



Stage 4: Look for consistent features from different methods

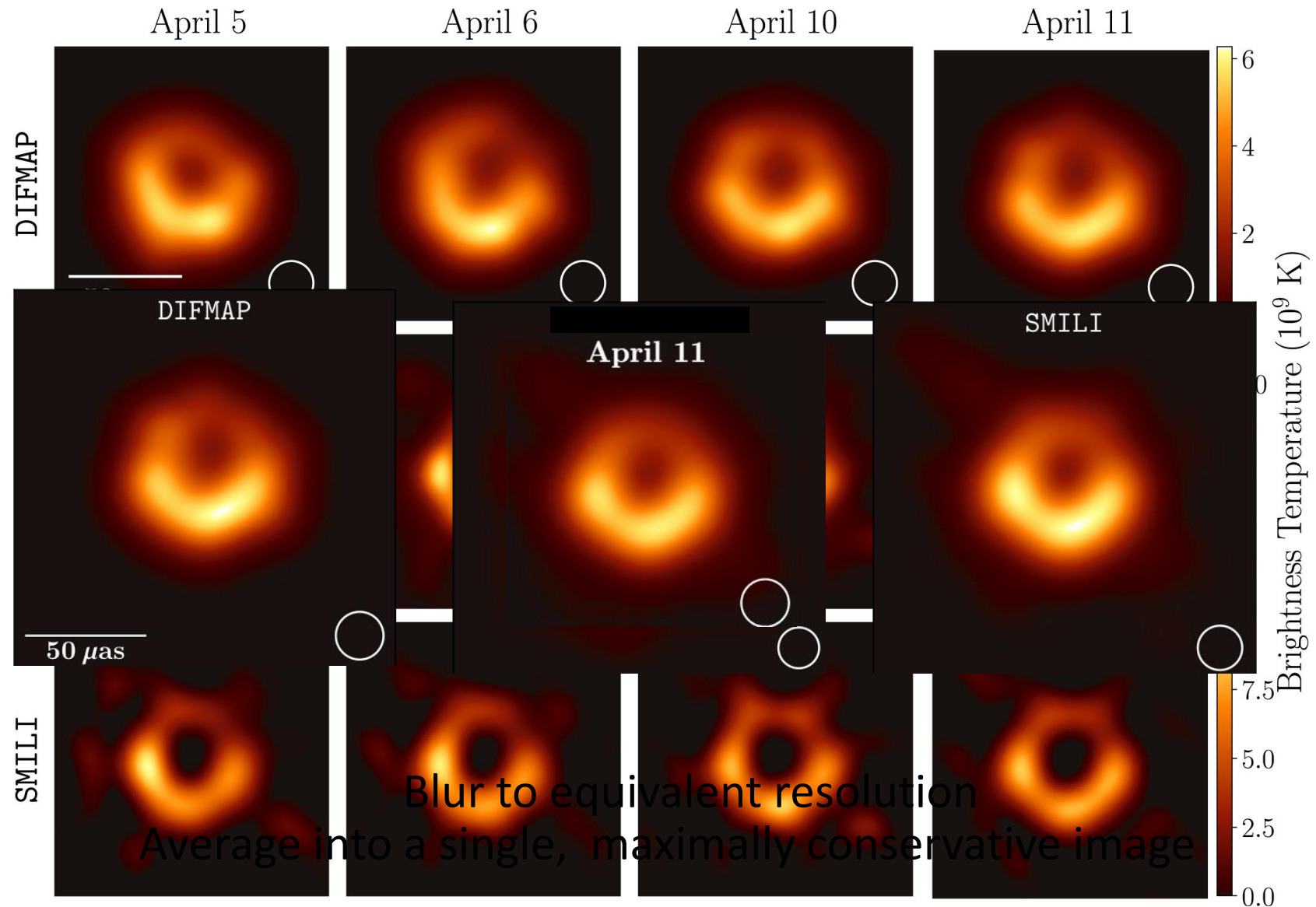
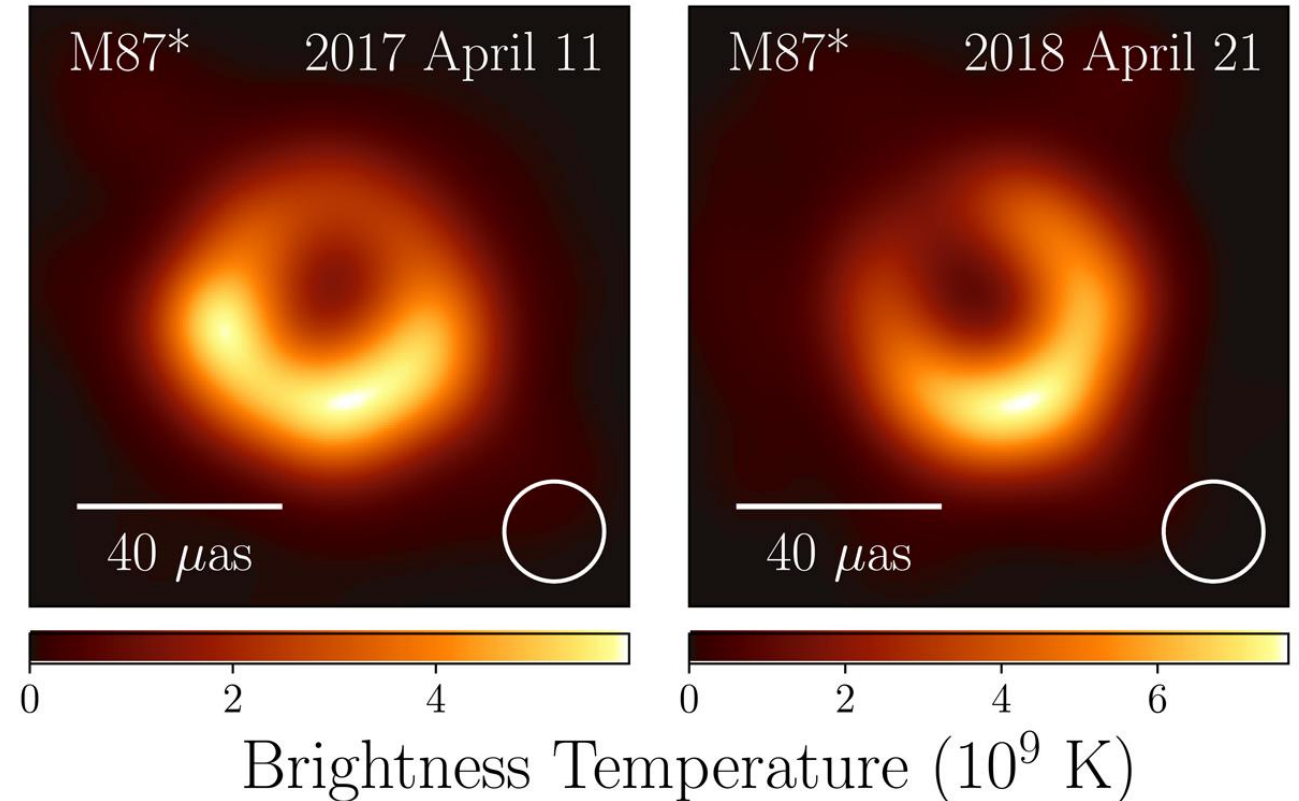


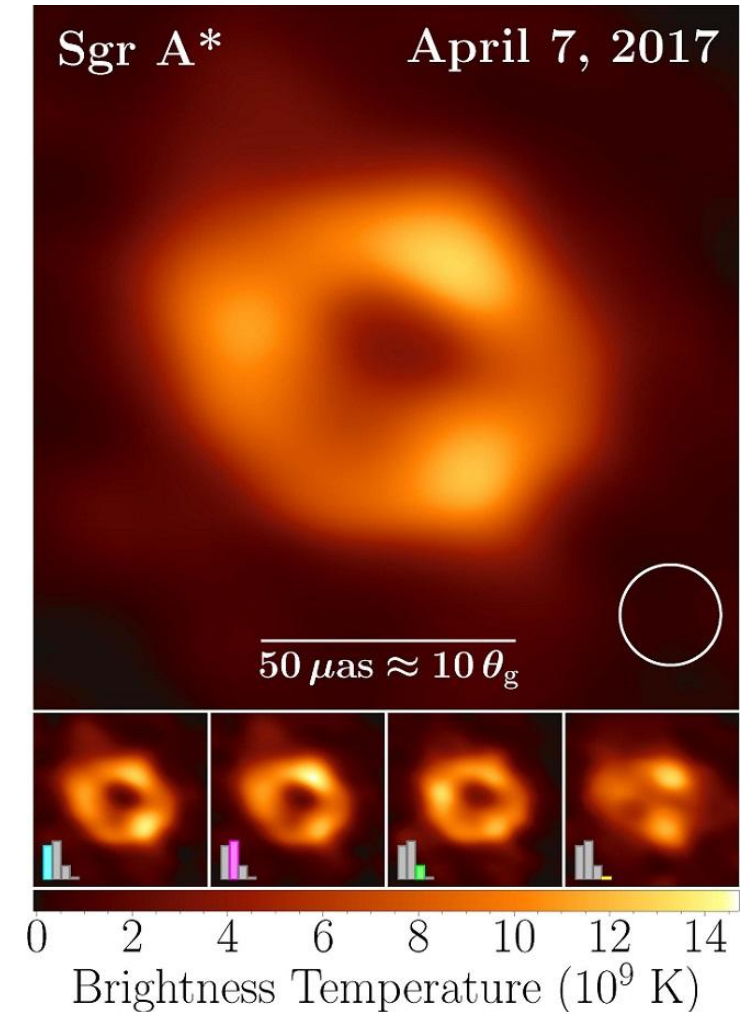
Image persistence across years

- 2018 observations show consistent horizon-scale structure in M87* **1000 gravitational timescales later.**
- Observations performed with a **more complete array** (including Greenland Telescope)
- Image **diameter is consistent** but brightness **position angle shifts**
- Stay tuned for more soon....



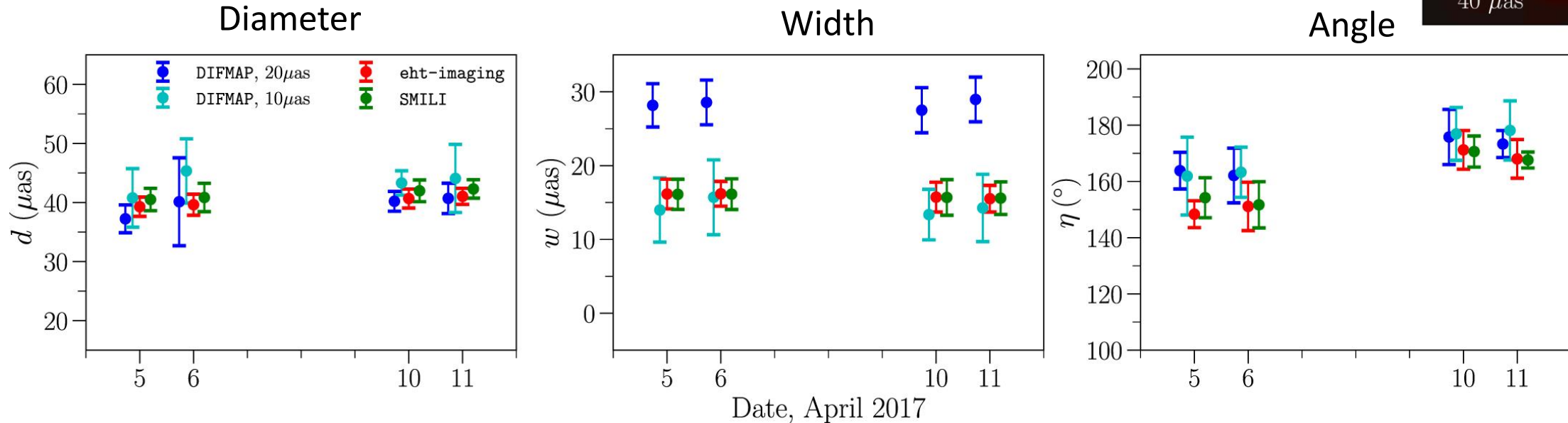
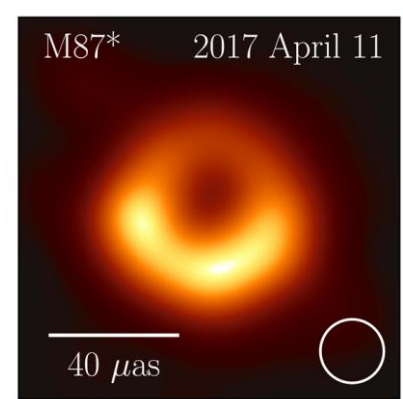
Our Galactic Center Black Hole: Sgr A*

- Imaging Sgr A* is **much more challenging than M87** due to rapid sub-hour **variability** and **interstellar scattering**.
- Sgr A* images predominantly (but not uniquely) show a **$\approx 50 \mu\text{as}$ diameter ring**.
- Sgr A* images do not currently constrain the ring position angle
- Sgr A* is **more polarized** ($\approx 30\%$) than M87*, and it shows a similar **helical linear polarization pattern**.



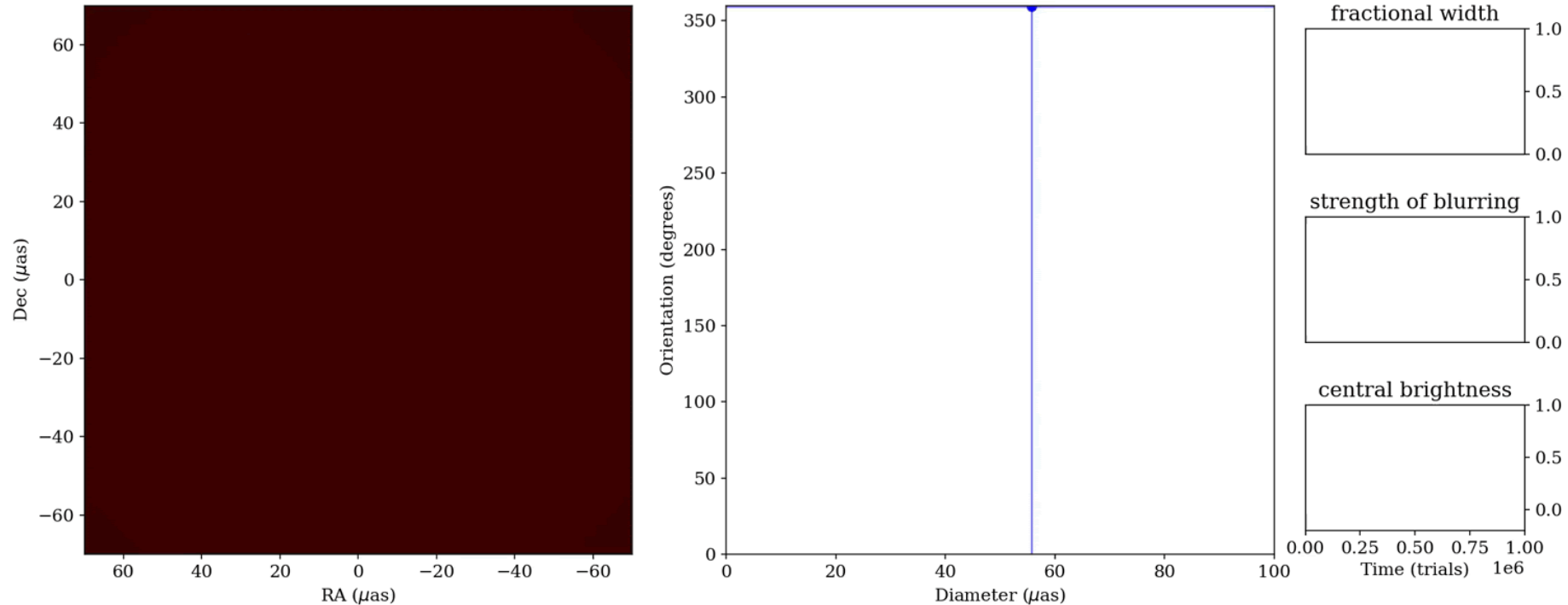
What do we learn from Black Hole Images?

M87 Properties (2017)

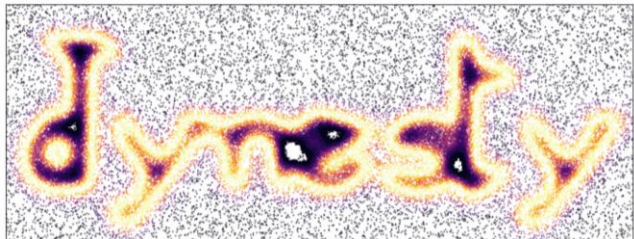


- Diameter $d \approx 41 \mu\text{as}$ is consistent across time and imaging method
- The width is **resolution dependent**, and is at best an upper limit.
- Orientation angle shows tentative $\approx 20^\circ$ CCW shift from April 5 – 11, 2017

Weighing a black hole with Geometric Modeling



dynesty



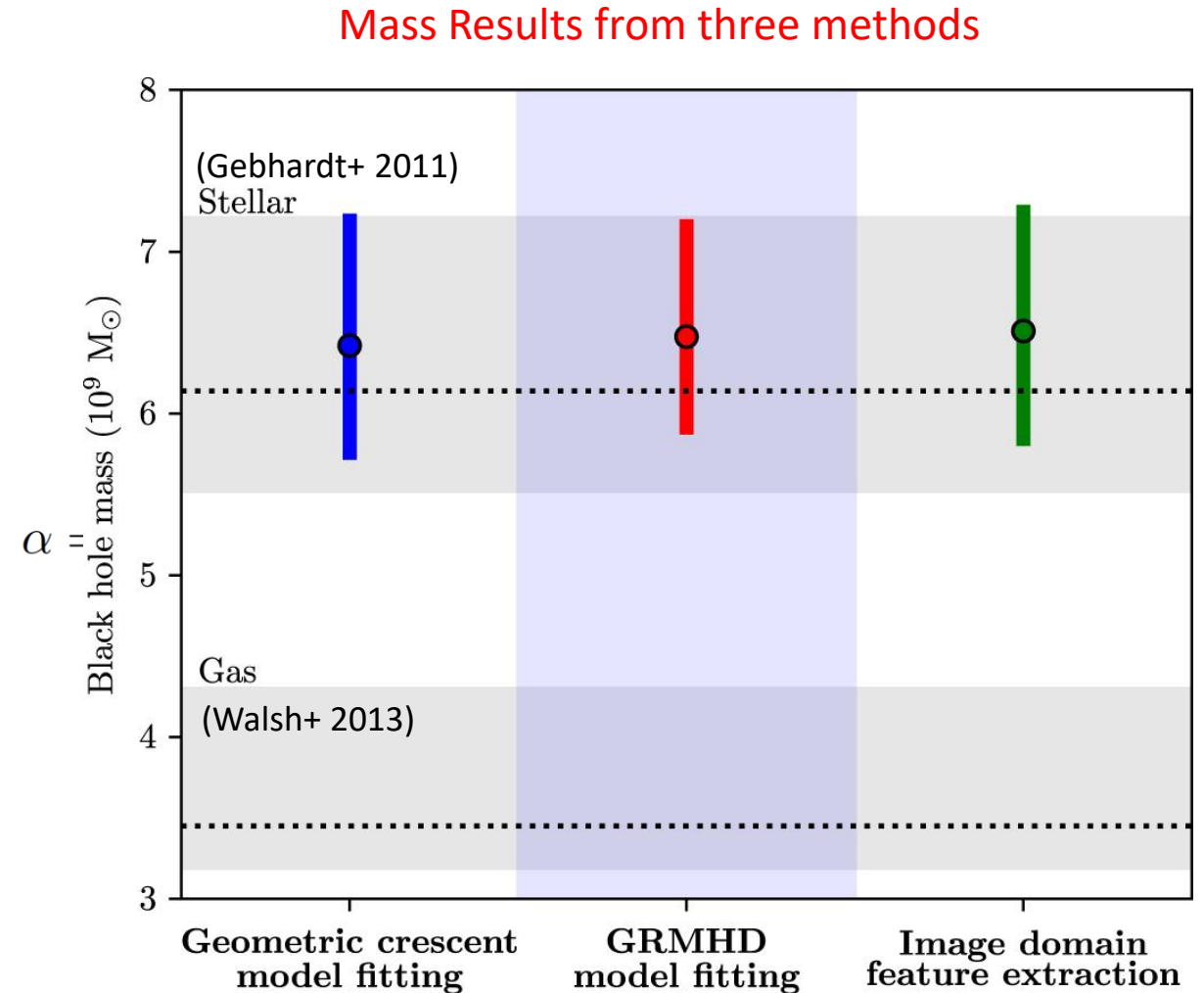
Dynesty: pure python nested sampling code
<https://github.com/joshspeagle/dynesty>

Also used several results from other MCMC codes and image reconstructions

EHT Paper VI, 2019
Animation Credit: Dom Pesce

Weighing a black hole

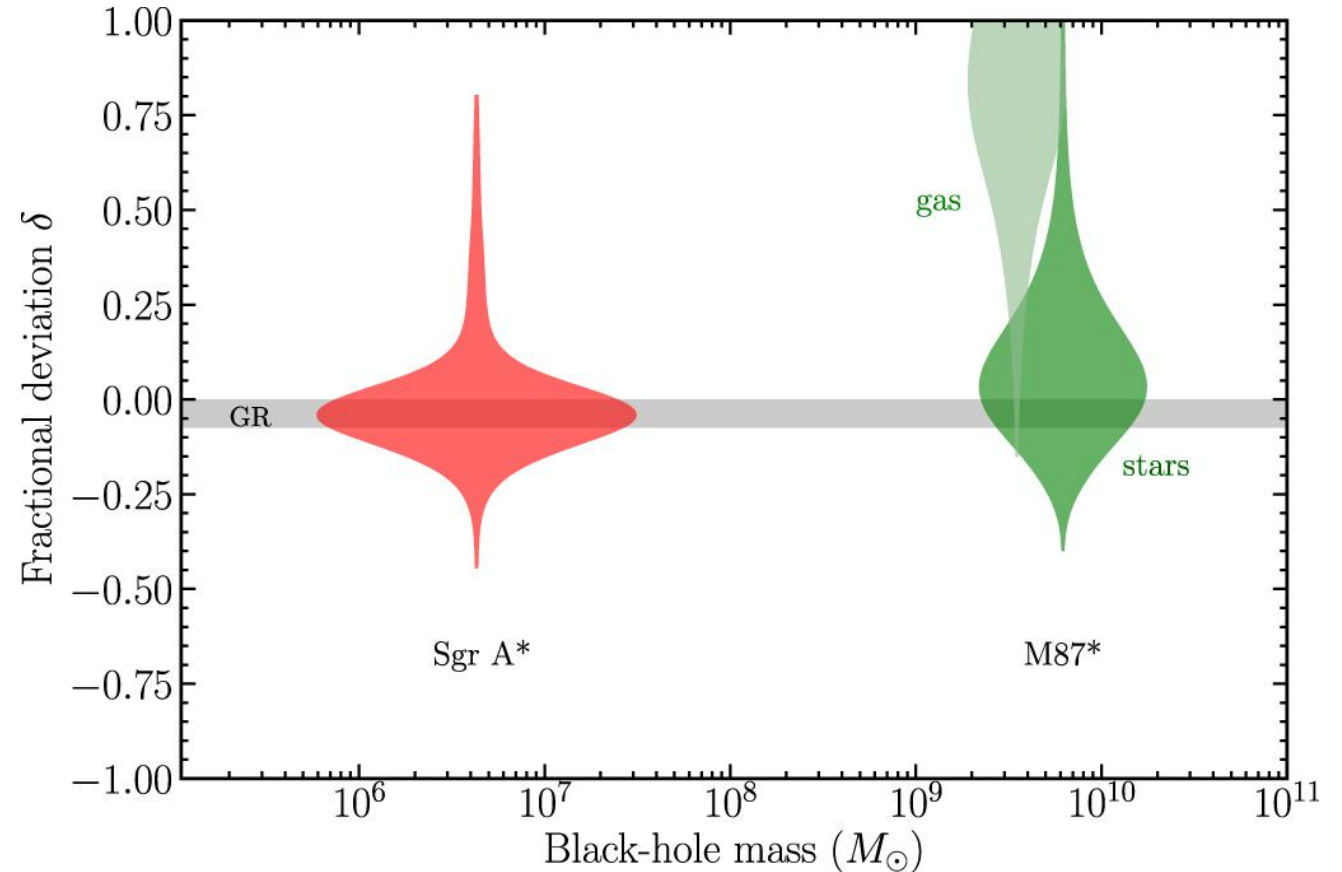
- Connecting EHT image ring diameter to predicted shadow size from GR requires **astrophysical** calibration
- M87* image size is consistent with previous measurements from stellar dynamics but not competing measurements from gas dynamics



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

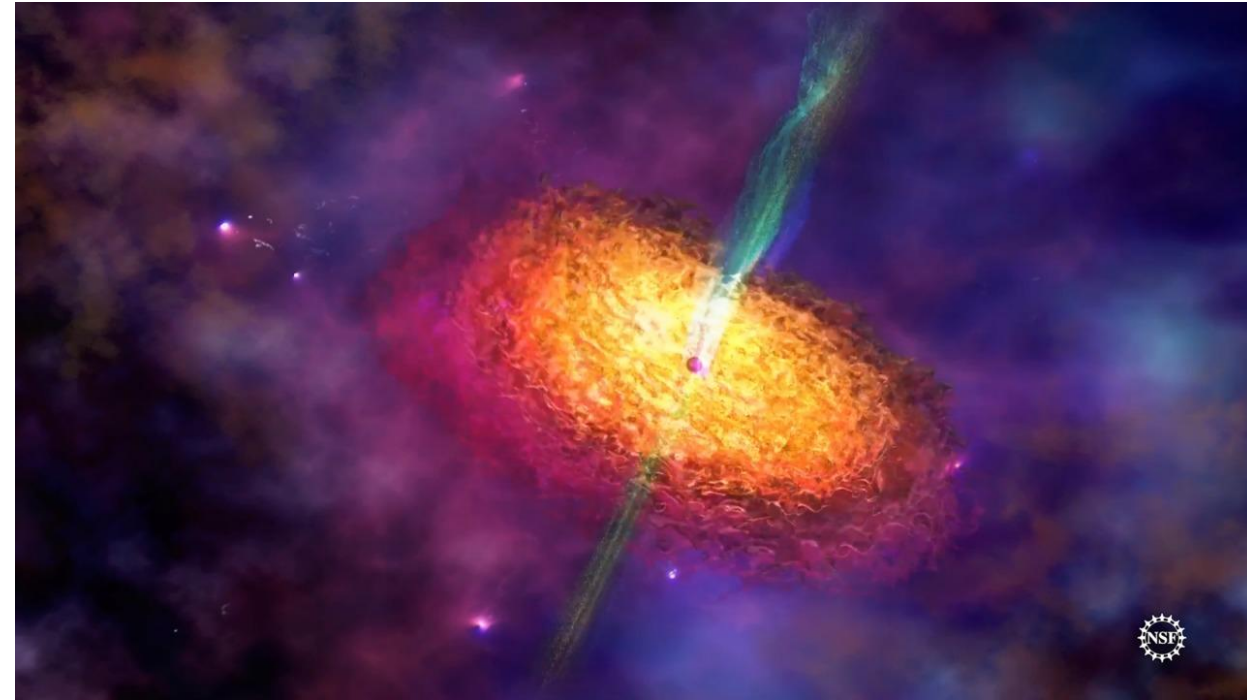
Weighing a black hole

- Connecting EHT image ring diameter to predicted shadow size from GR requires **astrophysical** calibration
- M87* image size is consistent with previous measurements from stellar dynamics but not competing measurements from gas dynamics
- After astrophysical calibration (and assuming a stellar mass prior) both M87* and Sgr A* have image sizes consistent with GR prediction.

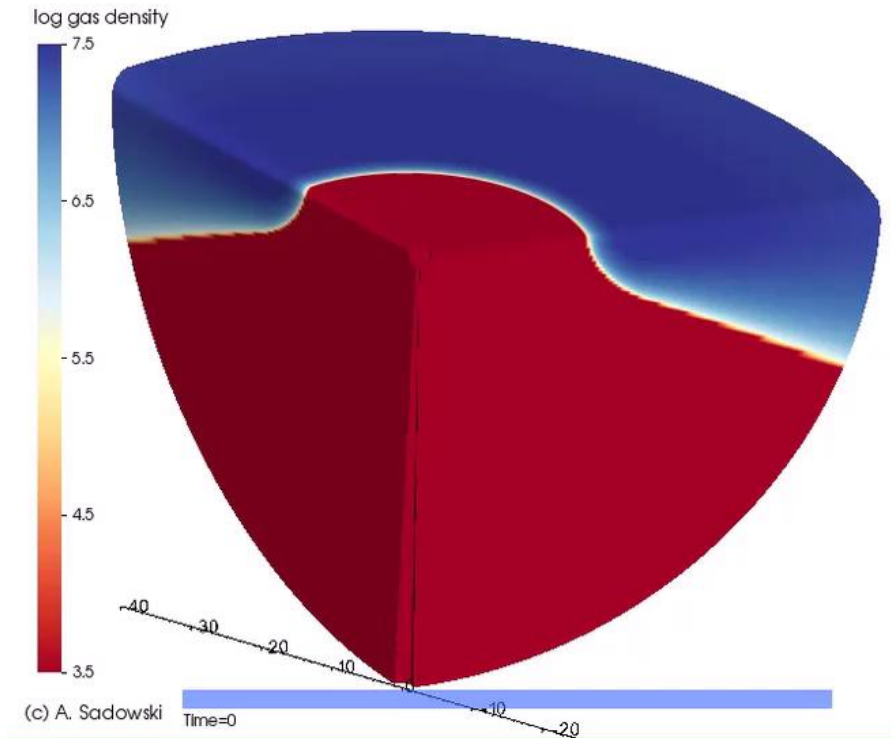


Astrophysics: what's going on near the event horizon?

- Thick accretion disk of hot plasma (tens of billions of degrees K)
- Strong and turbulent magnetic fields
- Launches a powerful relativistic jet



General Relativistic Magnetohydrodynamic Simulations



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

The background of the entire slide is a dense grid of red concentric circles. Each circle is composed of multiple overlapping rings, creating a complex, textured appearance. The circles are arranged in a regular, repeating pattern across the entire frame.

Simulation Image Library:

> 60,000 images

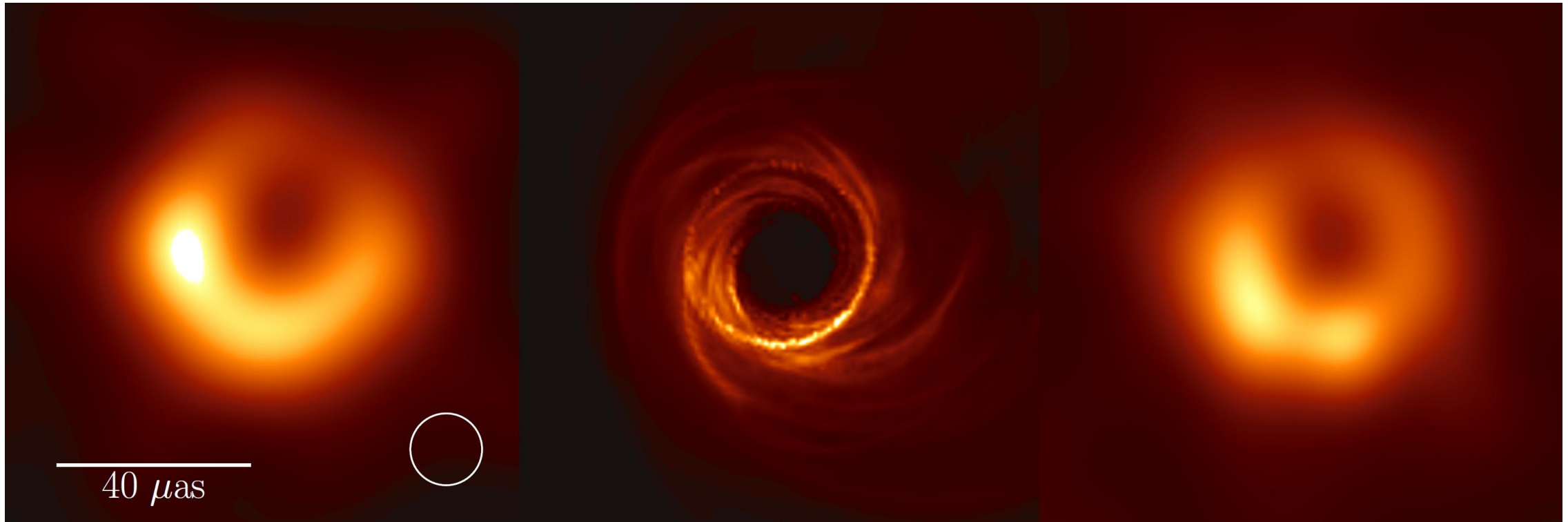
covering a range of parameters (spin, temperature,
magnetic field geometry...)

Simulations Match BH Images almost too Well!

EHT image

Simulated image
from a GRMHD model

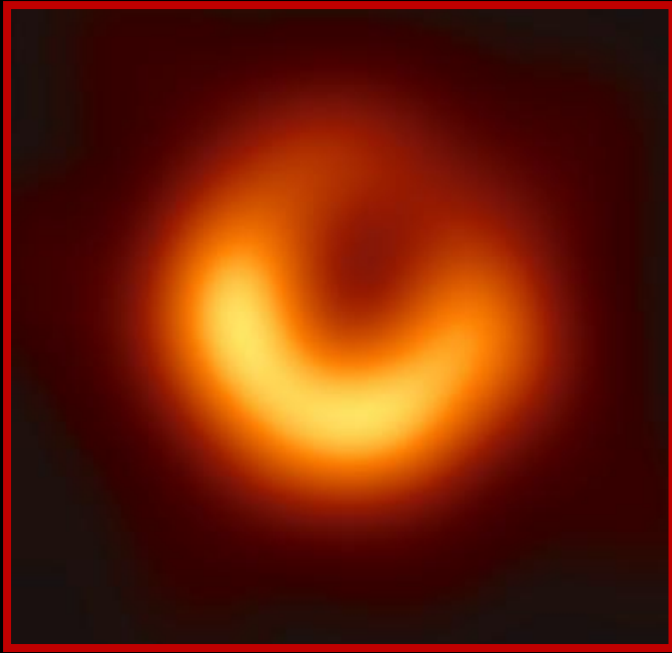
Simulated image reconstructed
with EHT pipeline



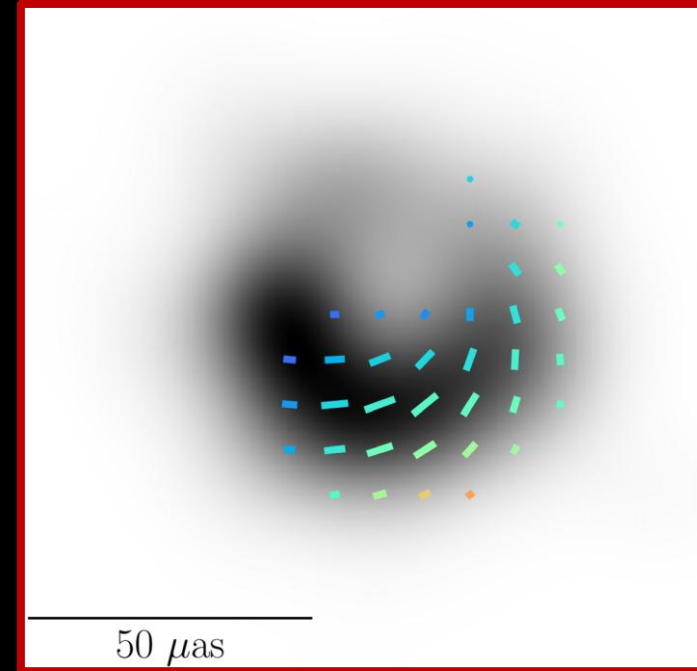
Initial EHT images were consistent with almost all of our simulations!

M87* in linear polarization

Total intensity



Linear Polarization

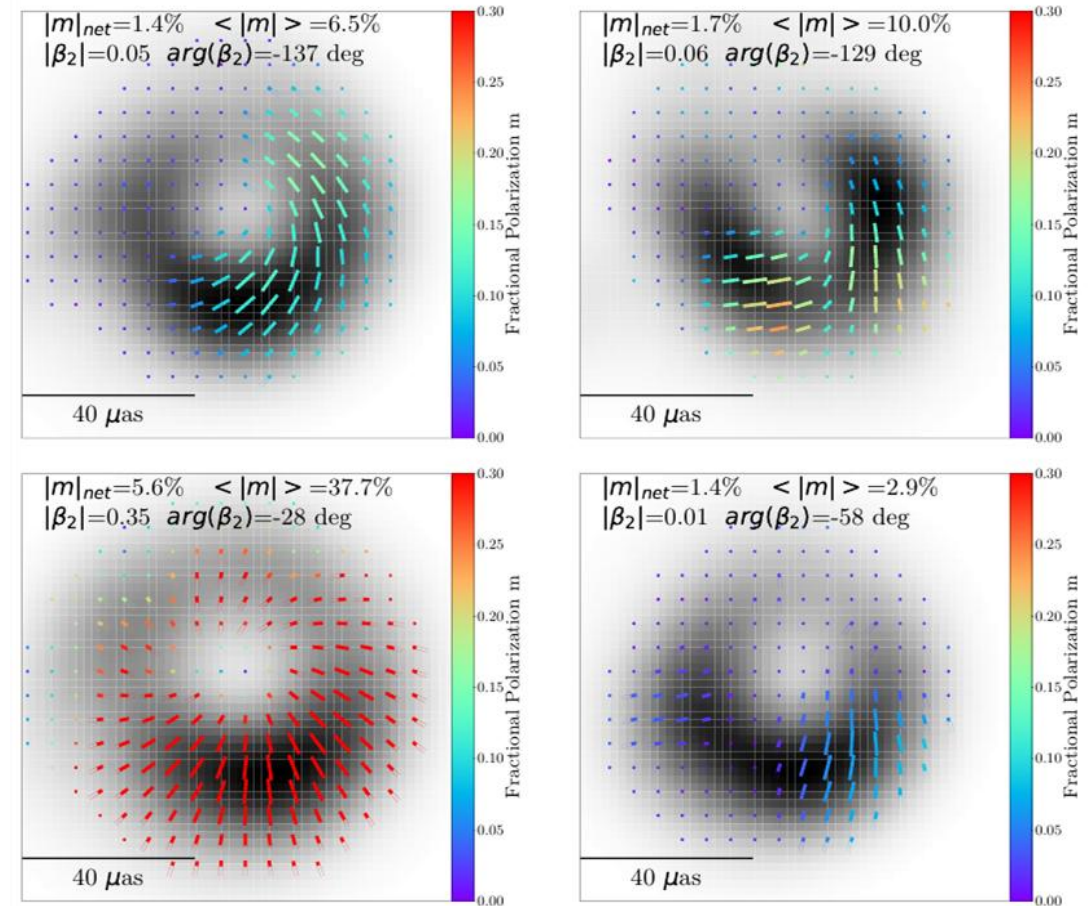


- Polarization is concentrated in the southwest
- Polarization angle structure is predominantly **helical**
- Overall level of polarization is **somewhat weak**, ~15 %

Polarization is the key for learning more

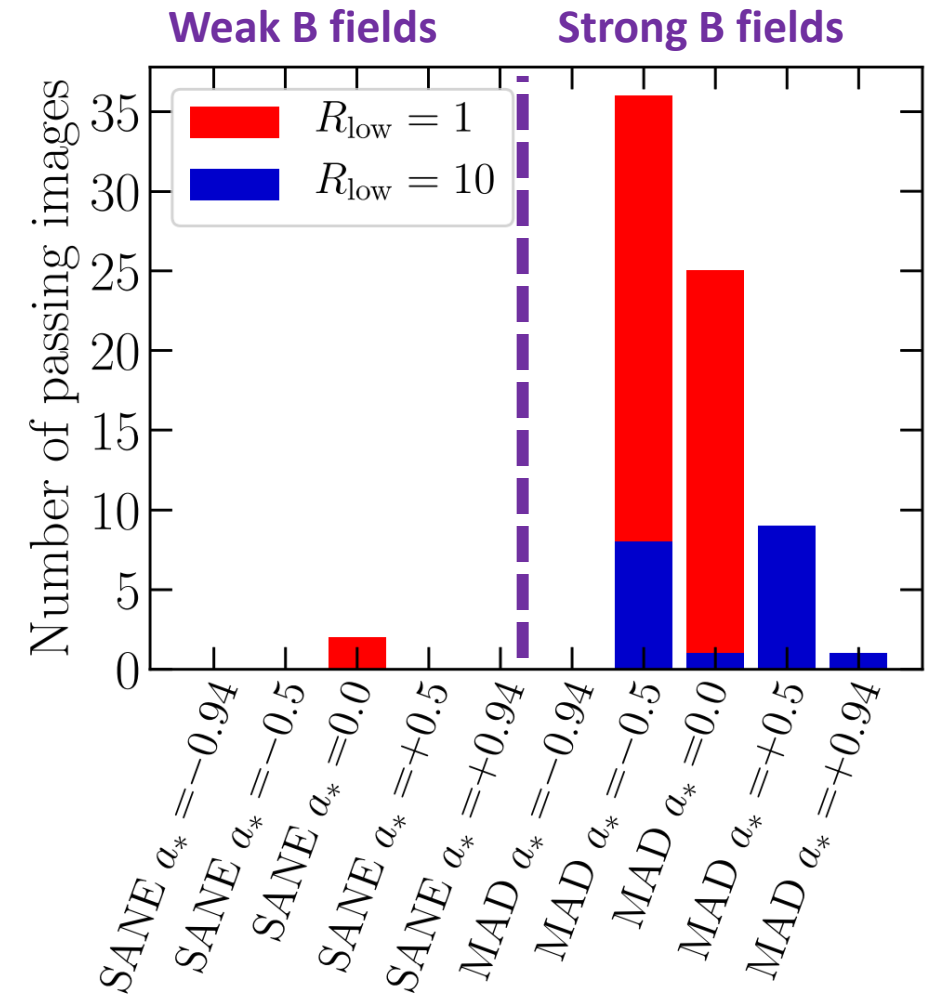
- Synchrotron radiation is emitted with polarization **perpendicular** to magnetic field lines
- Polarization is sensitive to the **magnetic field, plasma, and spacetime**.
- Simulation polarization images show many different structures:
 - **strongly** or **weakly** polarized
 - patterns that are **radial** or **helical**

Simulation Polarization Images



Polarization shows M87* has strong magnetic fields

- Scoring simulations with polarized images favors a **magnetically arrested accretion disk**
- Strong magnetic fields more easily launch jets by extracting black hole spin energy (Blandford & Znajek 1977)
- Can we use polarization to determine if magnetic fields extract energy from black holes?

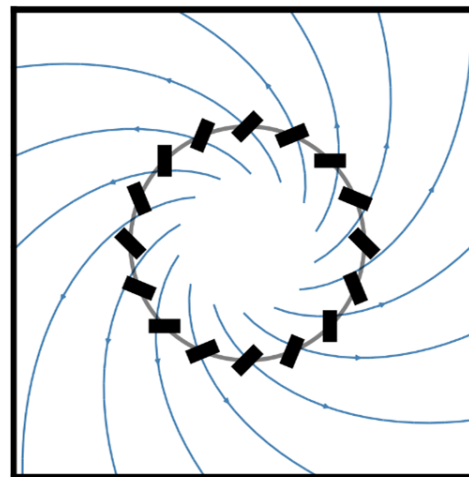


Polarization tracks electromagnetic energy flux

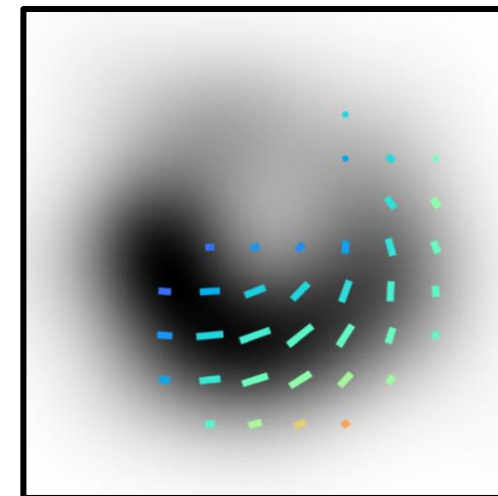
- We found (Chael+ 2023b) that the sign of the polarization spiral is directly connected to the direction of energy flow, assuming we know the angular velocity.
- Ignoring Faraday effects, **the EHT's polarization image implies electromagnetic energy flows away from the black hole in M87***
- If we can **zoom in** and **zoom out** on near-horizon polarization, we can potentially track energy flow from the black hole into the extended jet and look for black hole energy extraction (Gelles+ 2025, Chael+ in prep)

Energy Outflow

$$B^\phi / B^r < 0$$



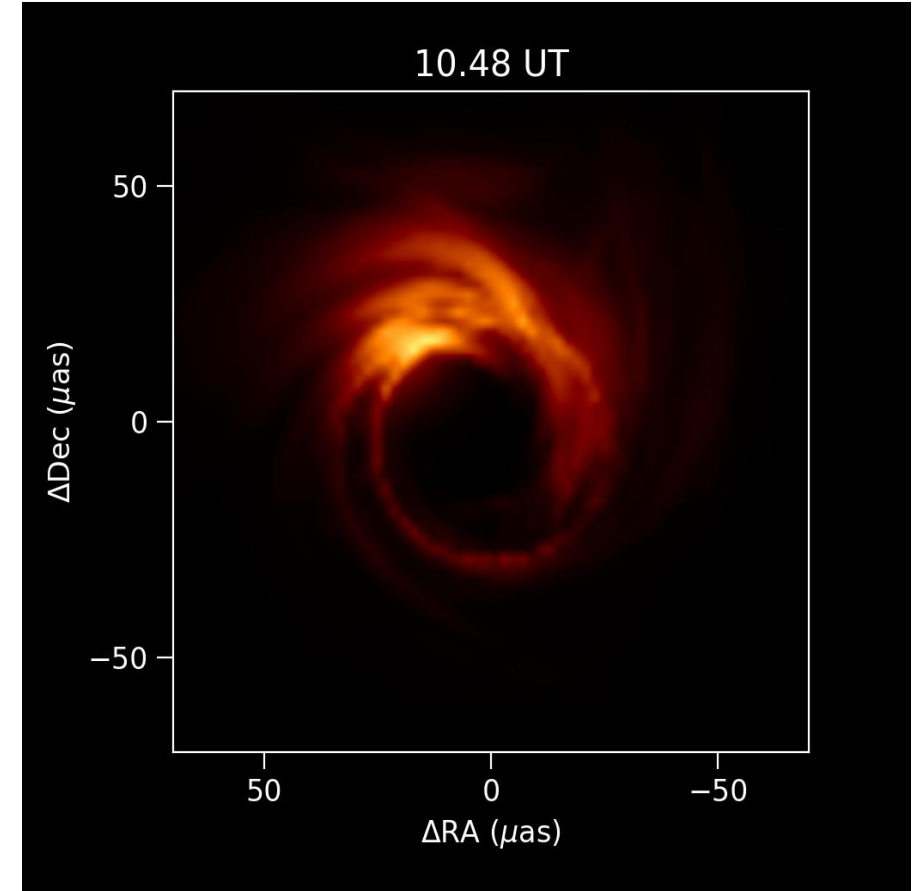
$$-\pi < \angle \beta_2 < 0$$



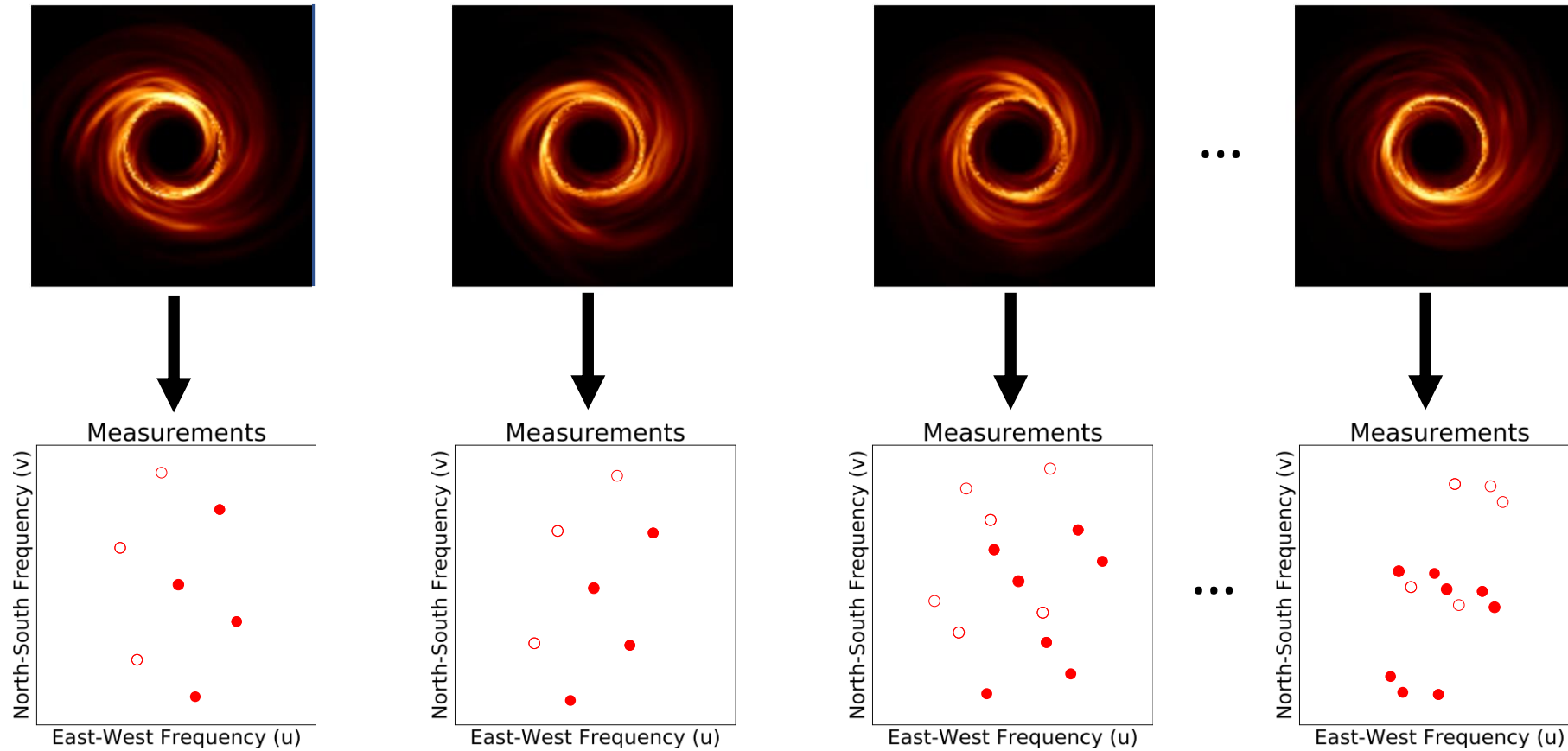
What will we see next?

Future directions: dynamics

- Black holes are highly dynamic – Sgr A* varies on minute-to-minute timescales and flares more than once a day!
- Tracking motion around the event horizon will allow for new tests of plasma physics, accretion, and gravity.
- But recovering a movie with traditional VLBI techniques is hard: need a combination of more telescopes and innovative reconstruction methods.

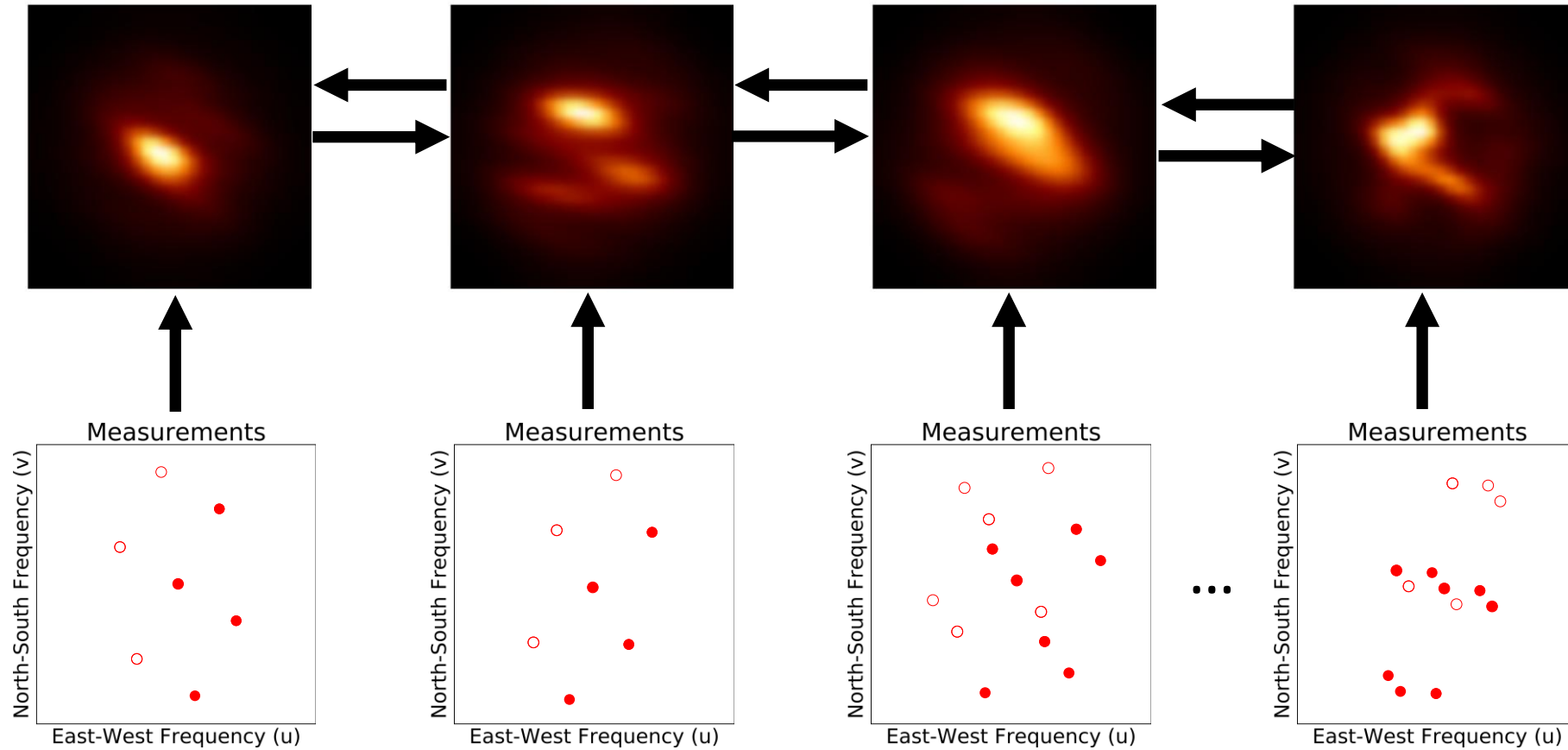


Future directions: dynamics



Each “frame” provides very little data

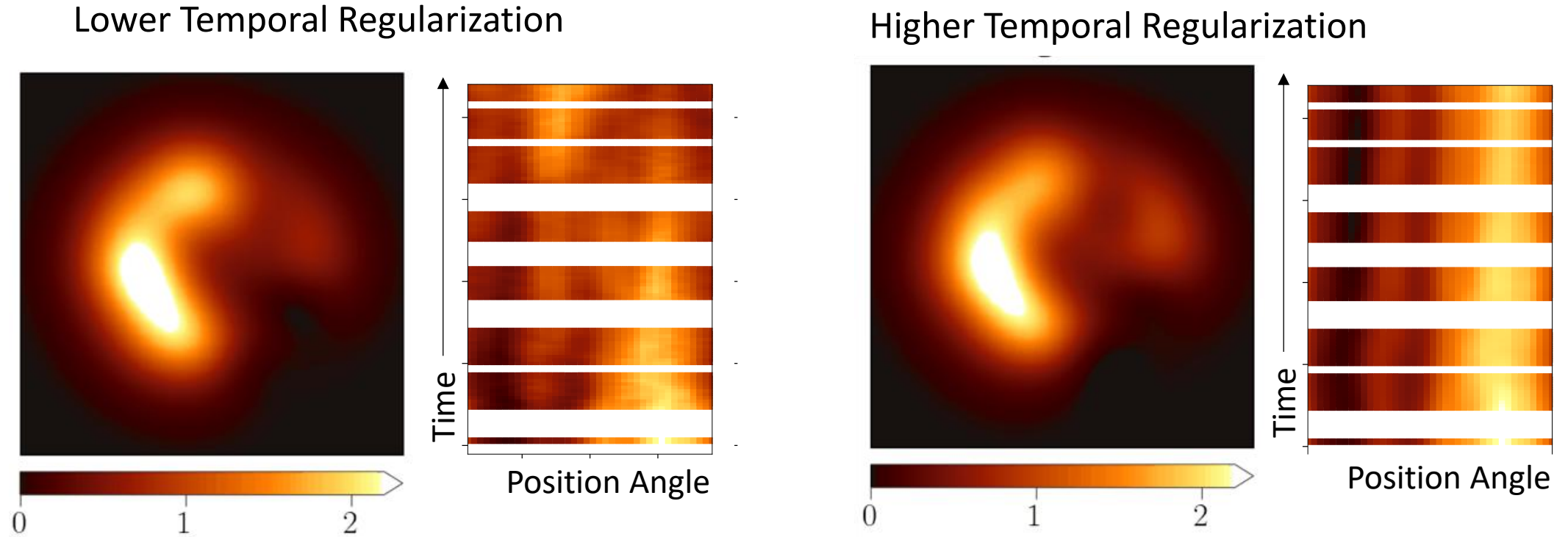
Future directions: dynamics



Each “frame” provides very little data
We need **temporal regularization**

Image credit: Katie Bouman

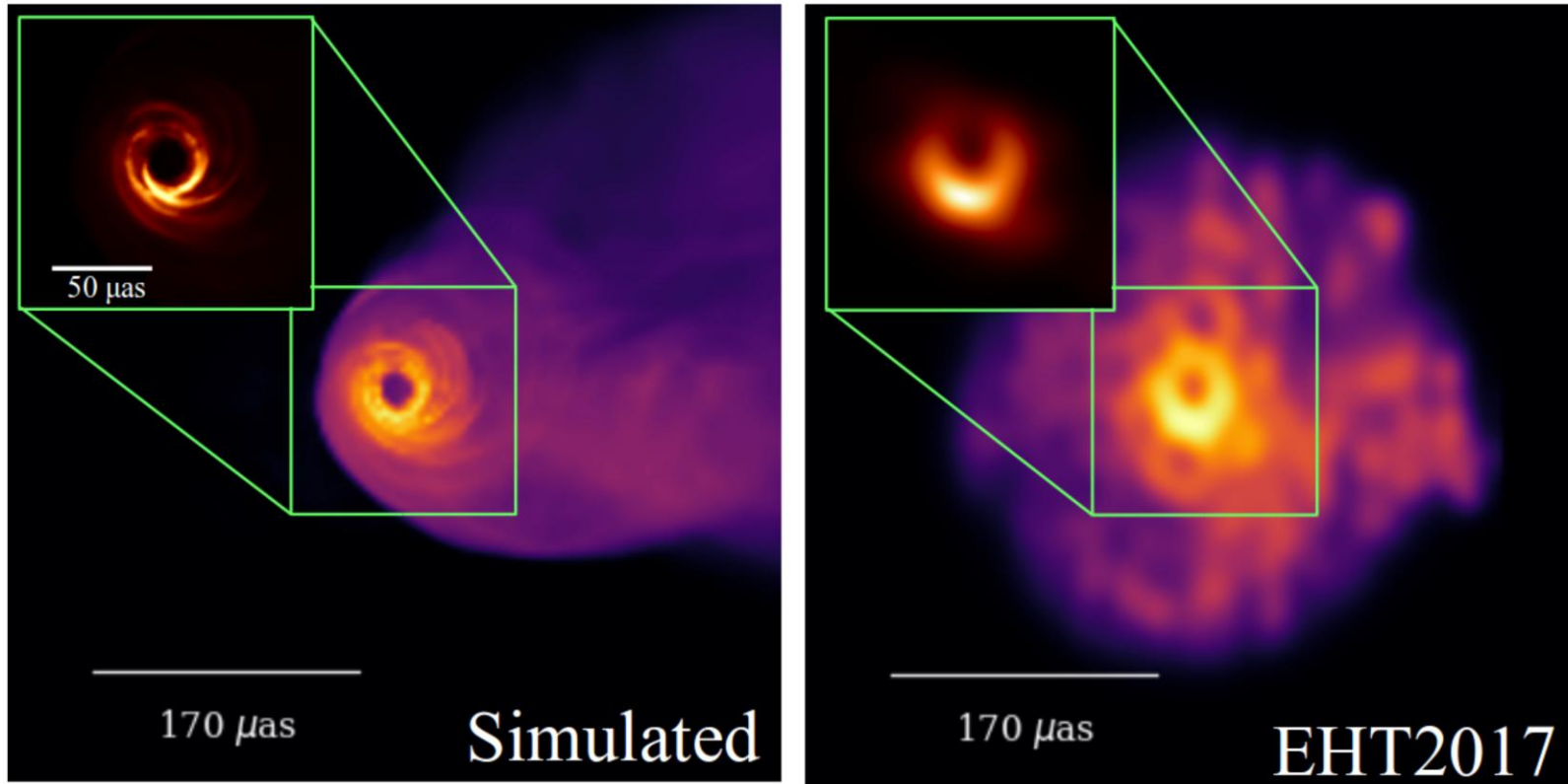
Imaging Dynamics: Sgr A* with StarWarps



Temporal Regularization: Each video frame should look similar to its adjacent frames (**StarWarps**: Bouman+ 2018)

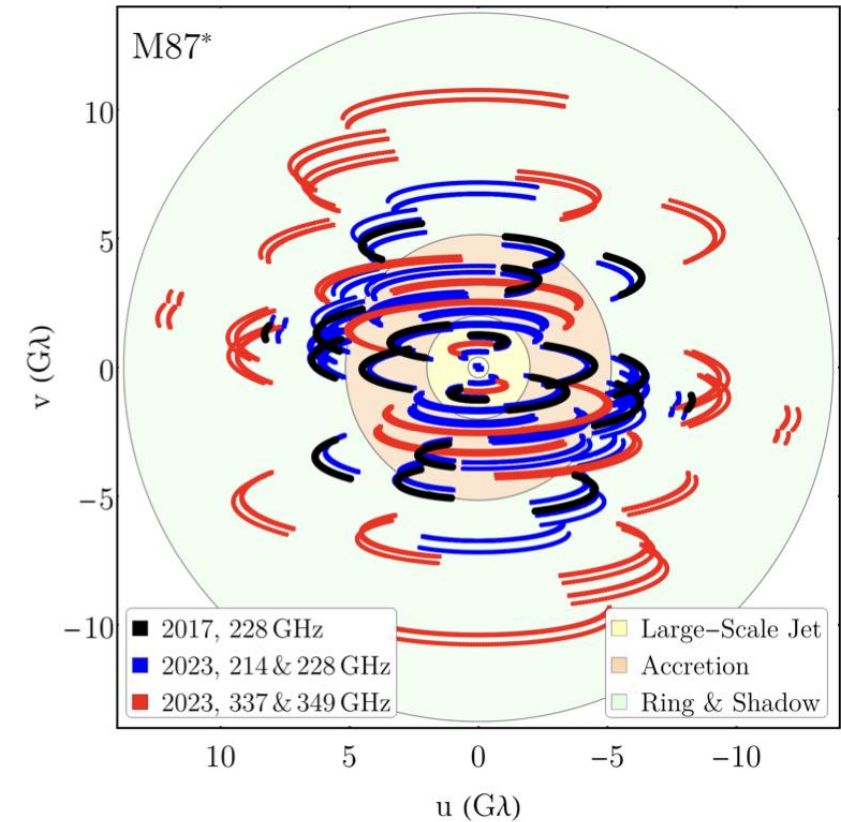
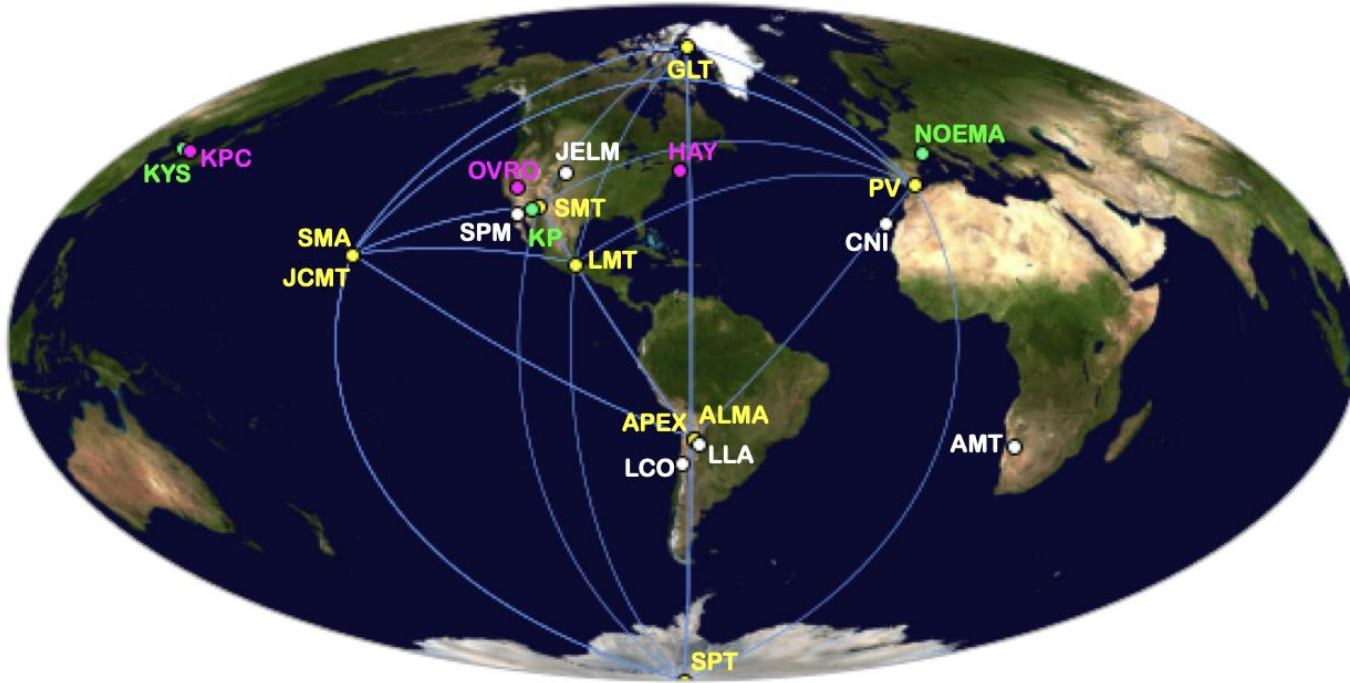
Which movie is more accurate? More data and testing are needed. Stay tuned!

Future directions: high dynamic range



- Past EHT observations have suffered from **limited dynamic range** from **array sparsity**

EHT array expansion



Increased coverage from new sites and observing frequencies in the EHT will enhance **dynamic range**

2017: Observations at 6 distinct sites

2018: Observations at 7 sites (+ GLT)

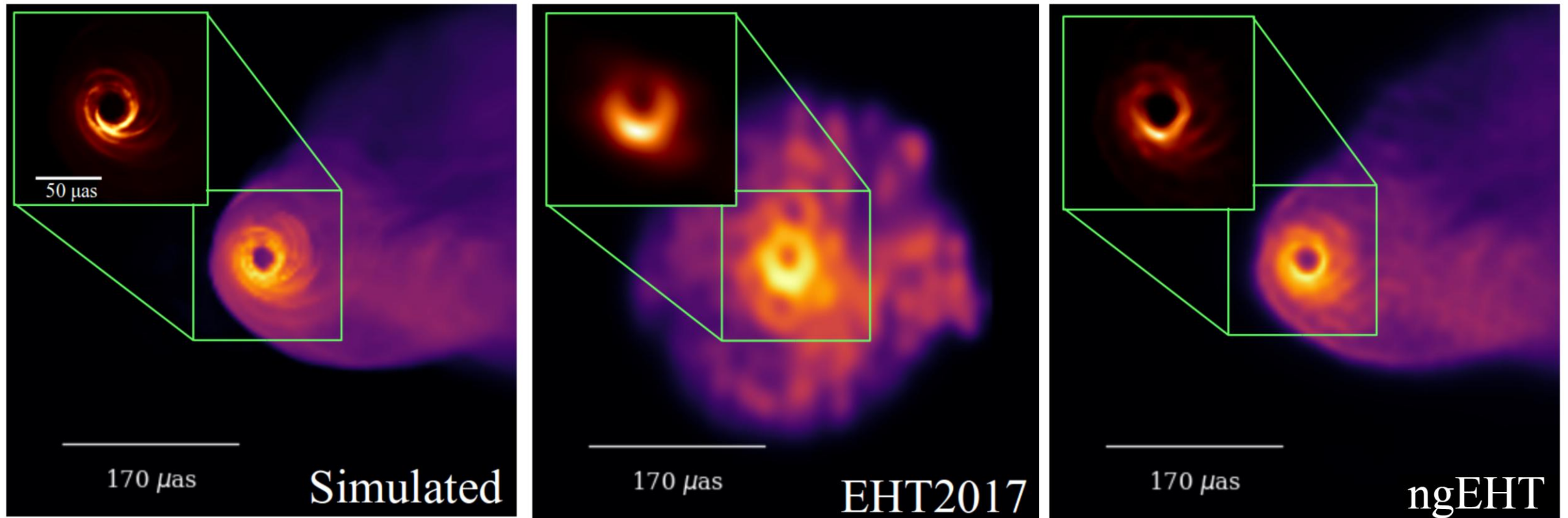
2021-22: Observations at 9 sites (+ Kitt Peak & NOEMA)

2024-25: 230+345 GHz observations

2025-2030s: observations at 15+ sites

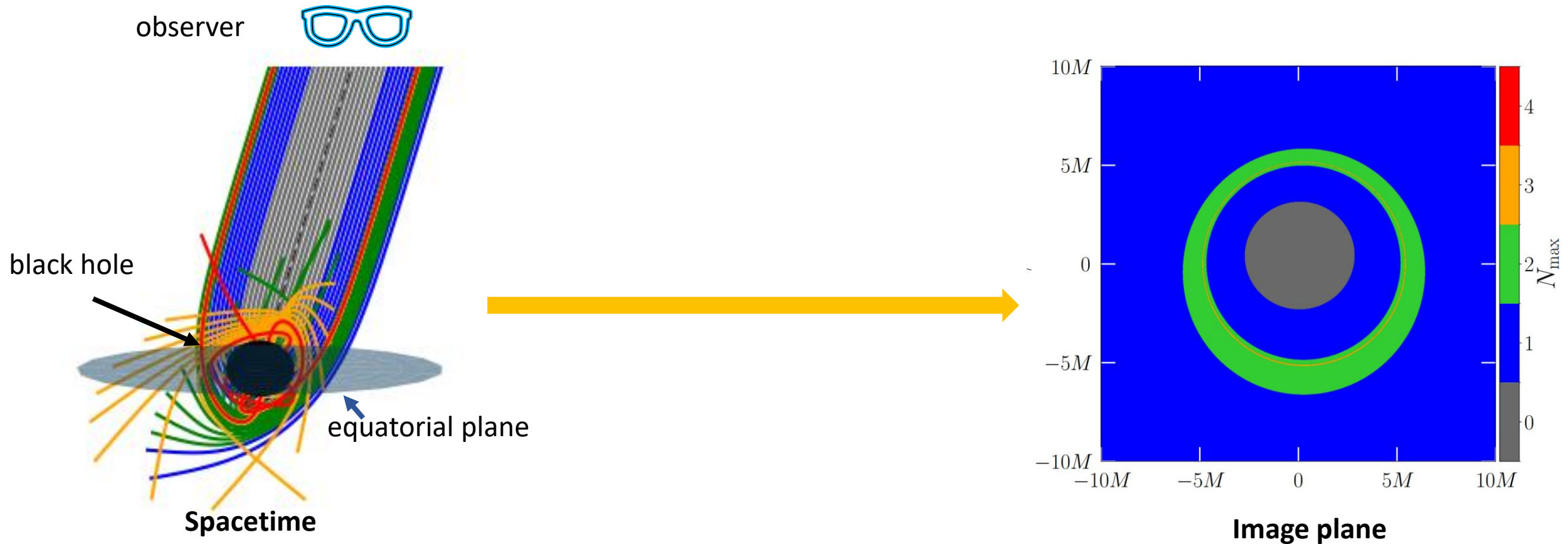
$$N_{\text{obs}} = \binom{N_{\text{sites}}}{2} \propto N_{\text{sites}}^2$$

Future directions: high dynamic range



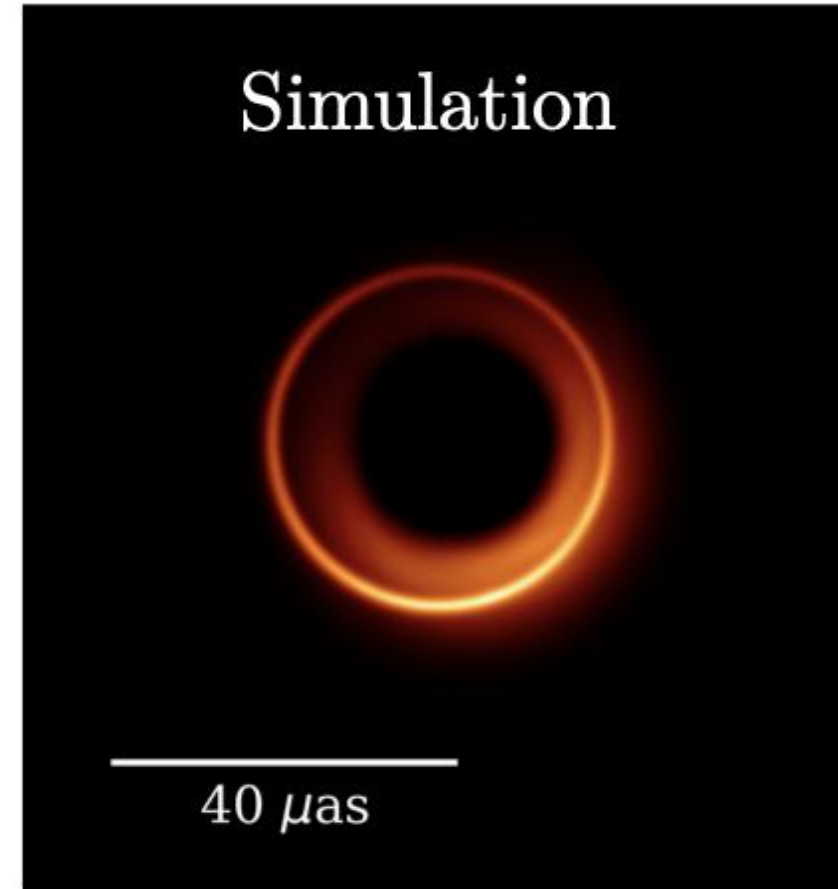
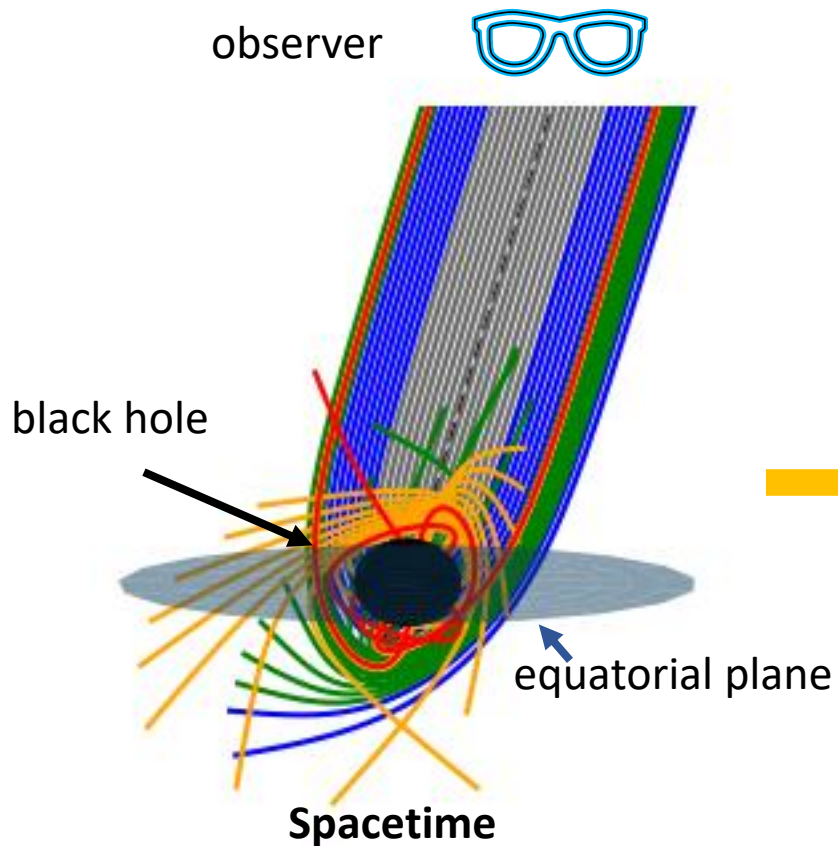
- Increased (u,v) filling from new telescope sites will enhance image **dynamic range**
 - High dynamic range images will illuminate the **BH-jet connection**
 - High dynamic range images may also reveal the **‘inner shadow’**

Future directions: high resolution



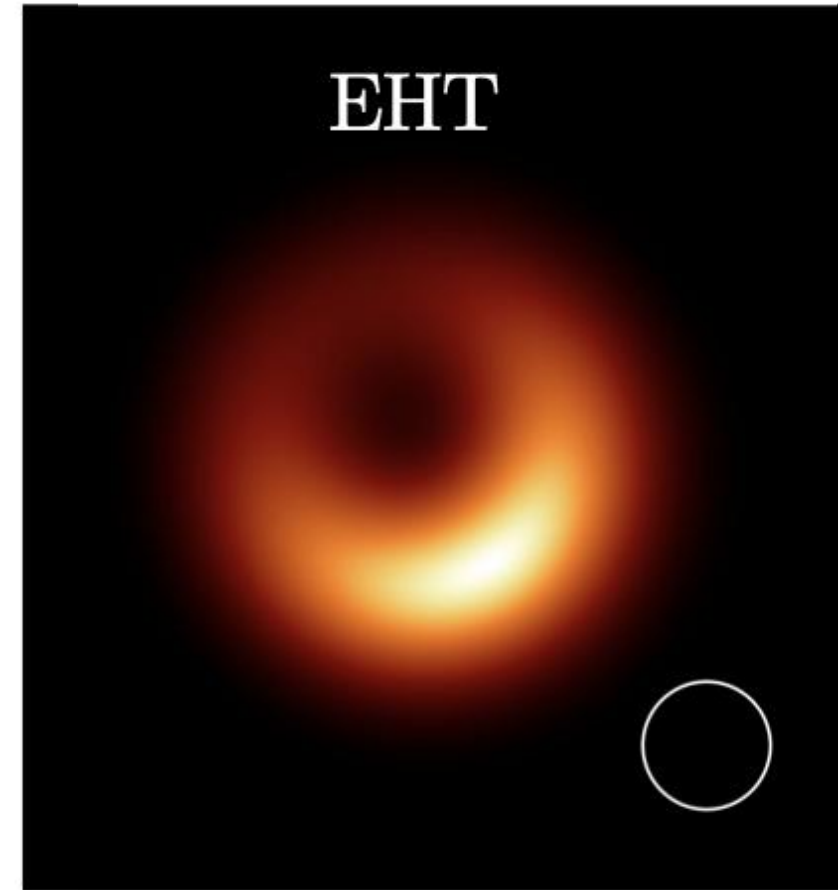
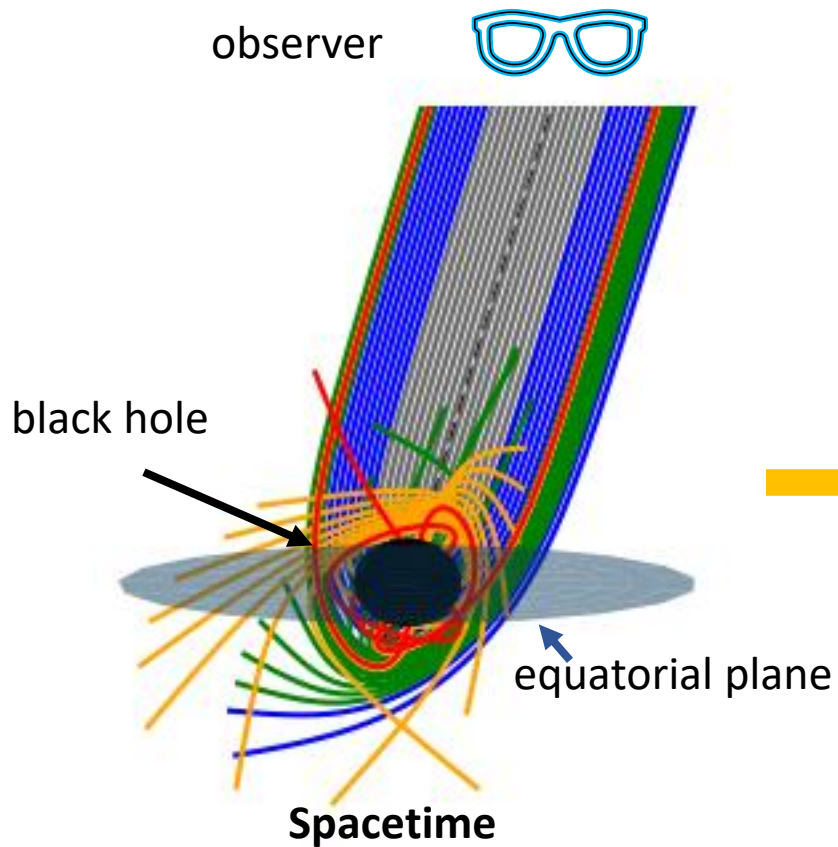
**Strongly lensed light rays that wrap around the BH
form narrow photon rings on the image**

Future directions: high resolution



**Strongly lensed light rays that wrap around the BH
form narrow photon rings on the image**

Future directions: high resolution



**Strongly lensed light rays that wrap around the BH
form narrow photon rings on the image**

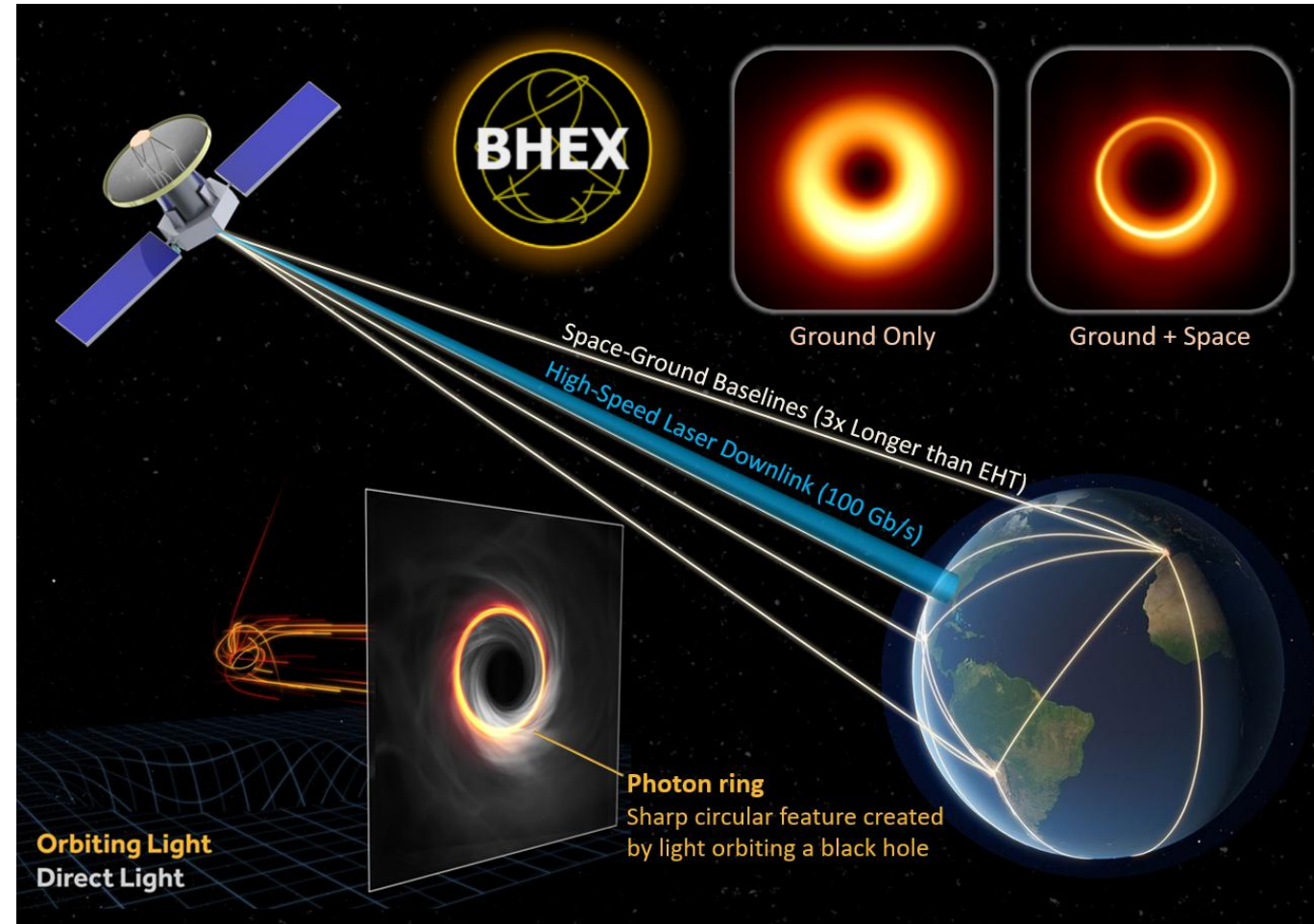
The Black Hole Explorer (BHEX)

Earth-Space VLBI at 1.3 mm

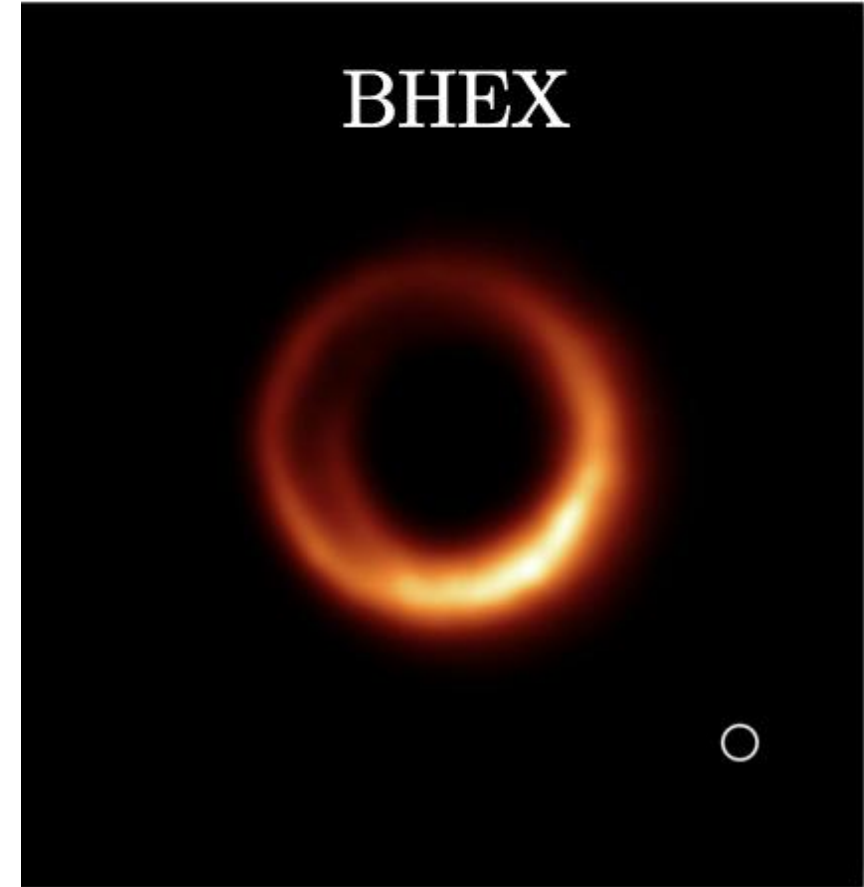
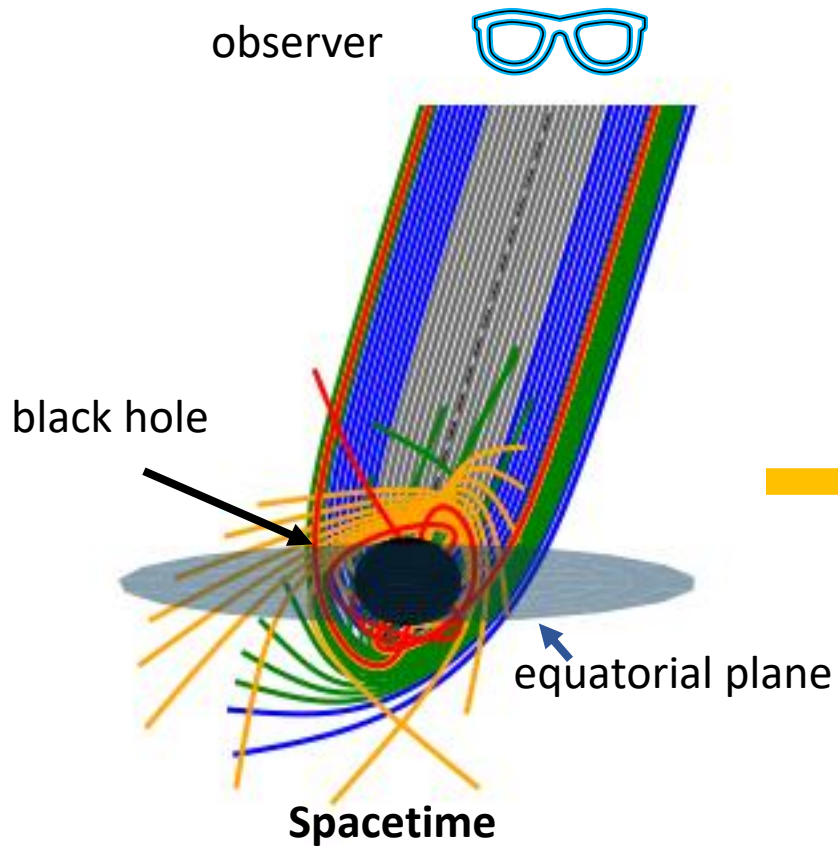
- 3.5 m dish in 20,000 km orbit
- Simultaneous dual-band observations (80 + 240 GHz)
- Leverages existing ground infrastructure & pioneers optical laser downlink
- Targeting a NASA SMEX proposal

BHEX Science Goals

- Discover a black hole's photon ring
- Make direct measurements of a black hole's mass and spin
- Reveal the shadows of *dozens* of supermassive black holes

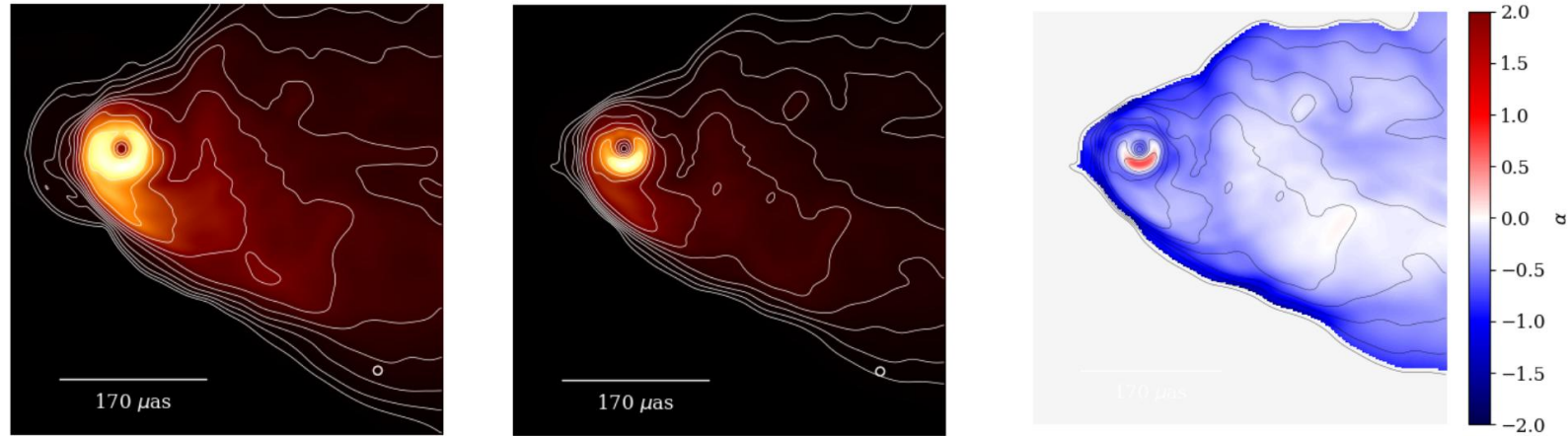


Future directions: high resolution



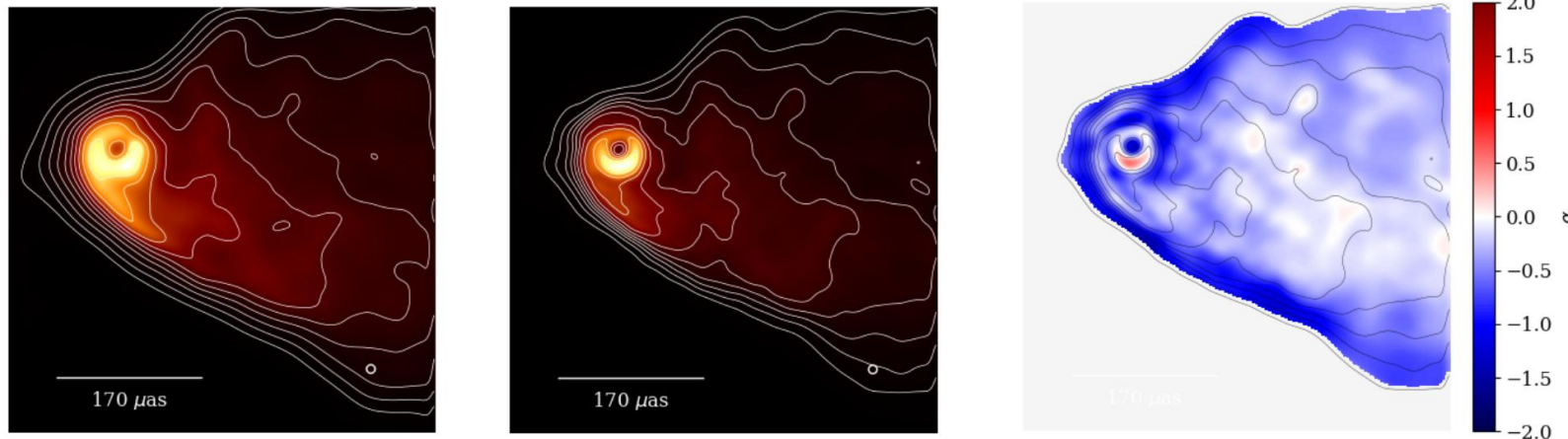
Pushing Black Hole Imaging Forward

Multifrequency Imaging in eht-imaging



Simulation

$$\log I_i(\vec{\theta}) = \log [I_0(\vec{\theta})] + \alpha(\vec{\theta}) \log \left(\frac{\nu_i}{\nu_0} \right)$$



Simulated image
using **multifrequency
synthesis**

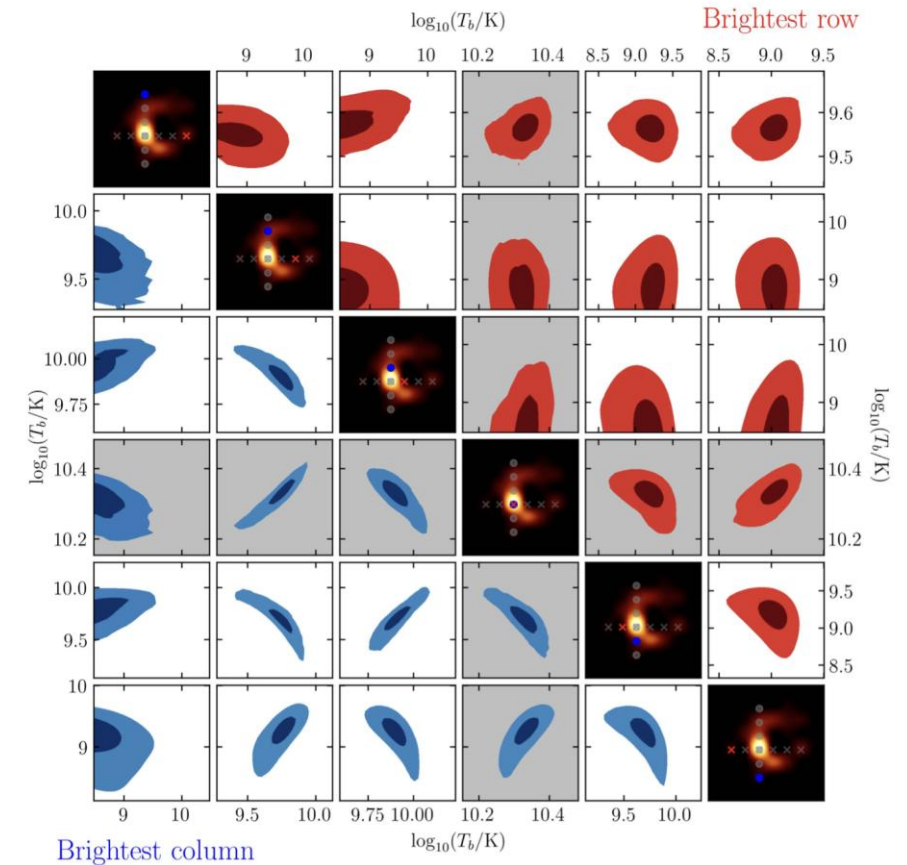
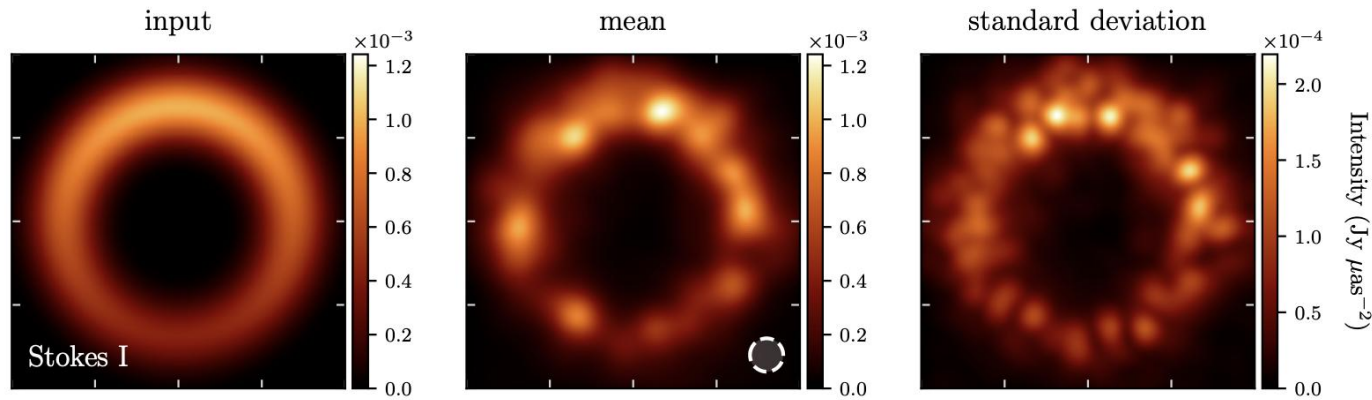
86GHz

230GHz

Spectral index

- Multifrequency imaging ties together data at frequencies to obtain a higher quality image
- Understanding the spectral behavior probes plasma properties

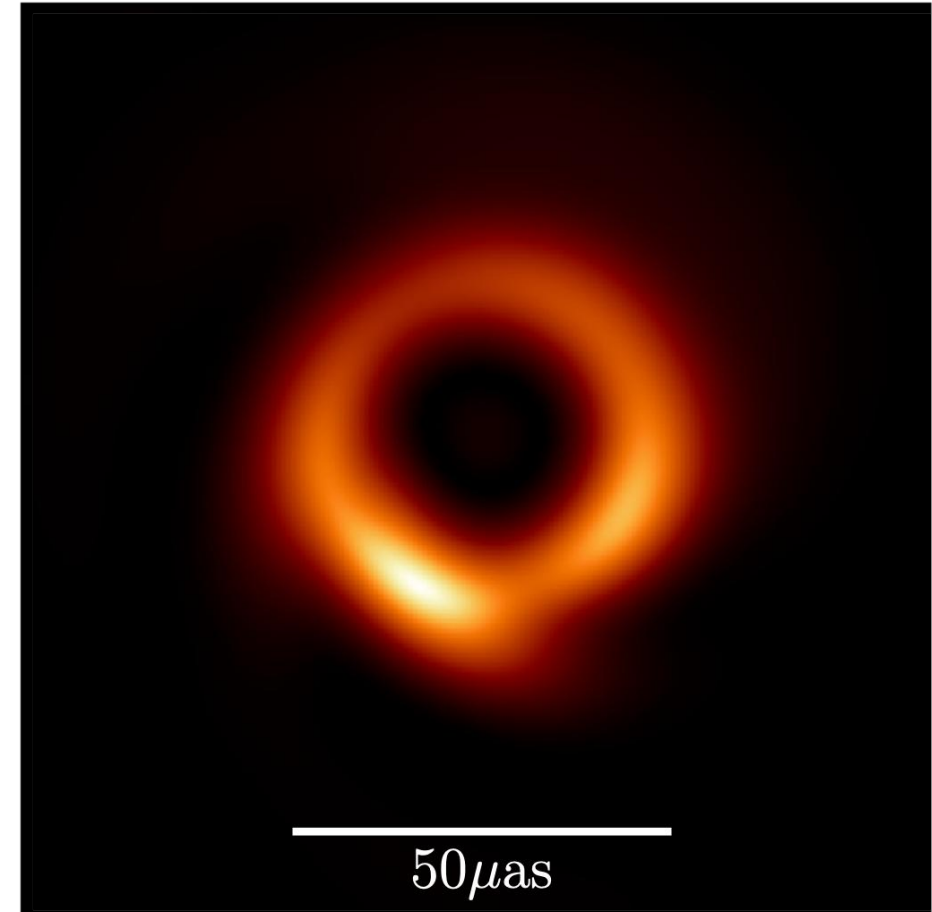
True Bayesian Imaging: Themis, DMC, Comrade



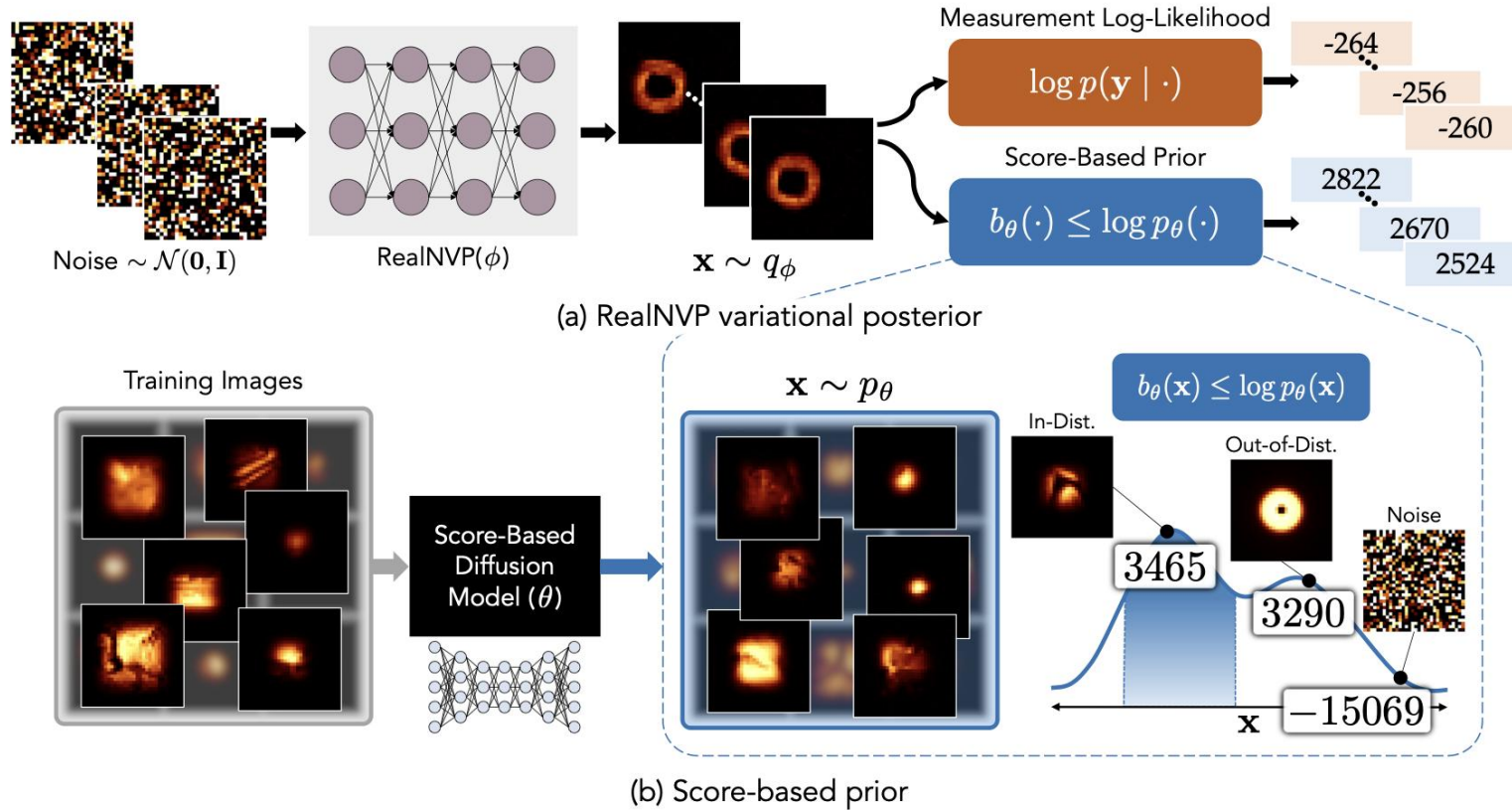
- New methods that use modern sampling techniques and GPU acceleration to measure posteriors for individual pixels in full polarization
- **The new standard** for understanding image parameter uncertainties
- Able to jointly solve for image, instrument gain terms, and prior hyperparameters

Black Hole Imaging with a PCA basis: PRIMO

- Uses PCA to learn an image basis from a large set of GRMHD simulations
- Fills in Fourier space in a physically motivated manner
- Does not produce “knot” image artifacts
- Can reconstruct images that are not contained in original simulation data set
- Allows for direct comparisons of results with simulations

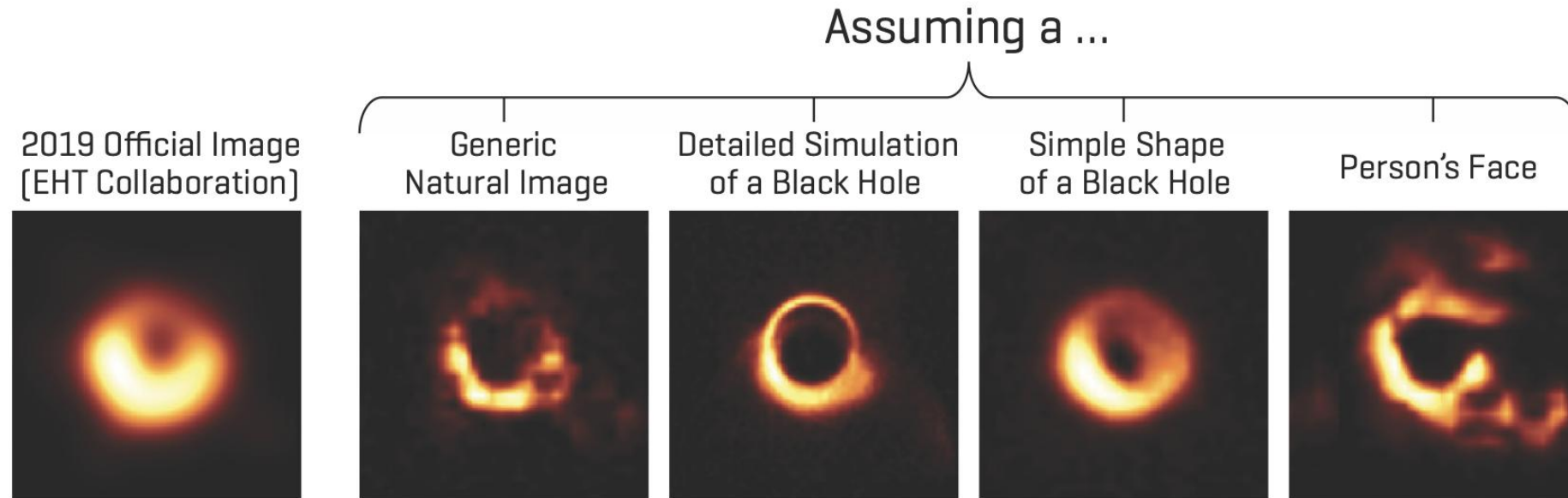


New Image Priors from Diffusion Models



New method to apply diffusion models trained on different image sets as image priors and estimate an EHT image posterior distribution with variational inference

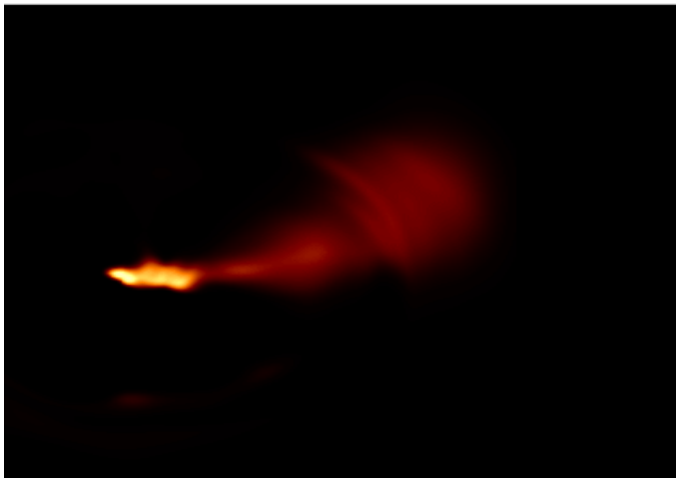
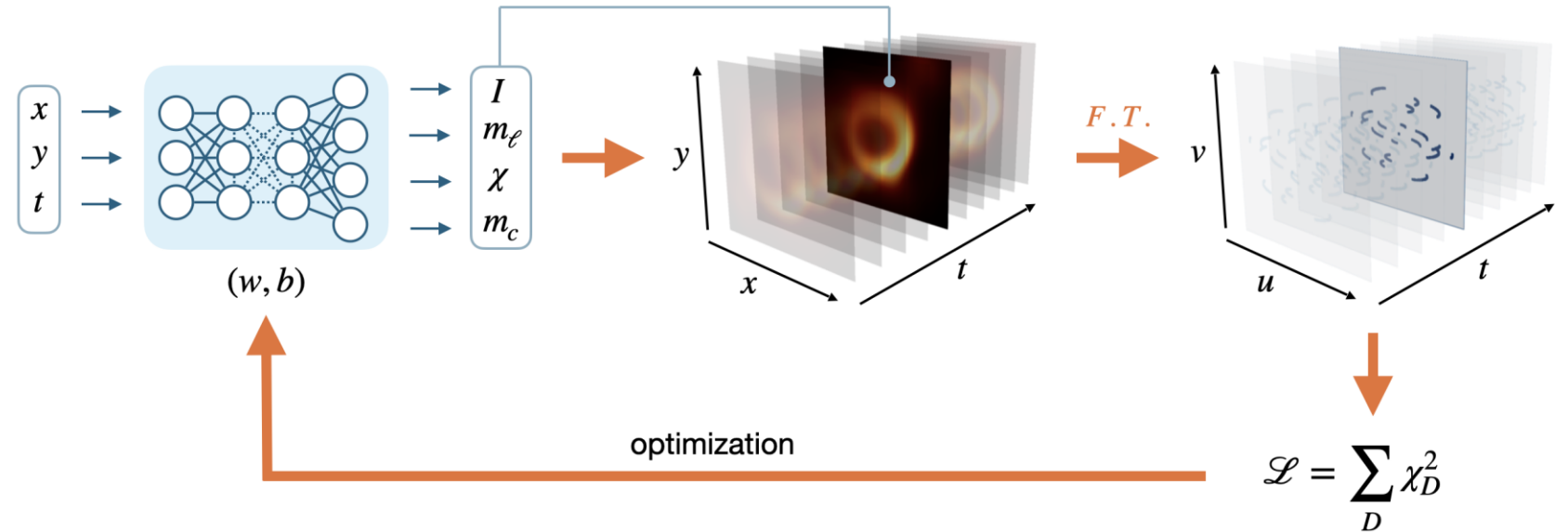
New Image Priors from Diffusion Models



New method to apply diffusion models trained on different image sets as image priors and estimate an EHT image posterior distribution with variational inference

Imaging Dynamics: kine

- Models image intensity and polarization in time as a neural network.
- No** explicit regularization.
- Shows improved performance over original temporal regularization methods in movie recovery.



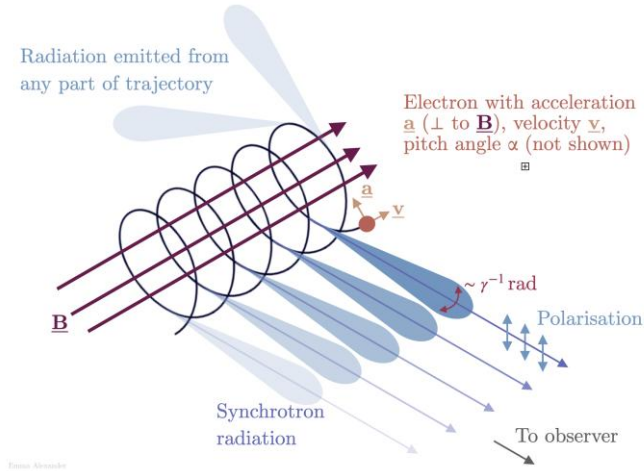
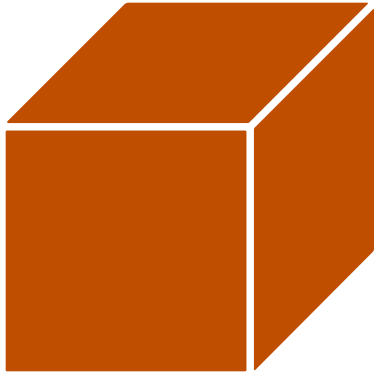
VLBA 3C345 reconstruction with kine



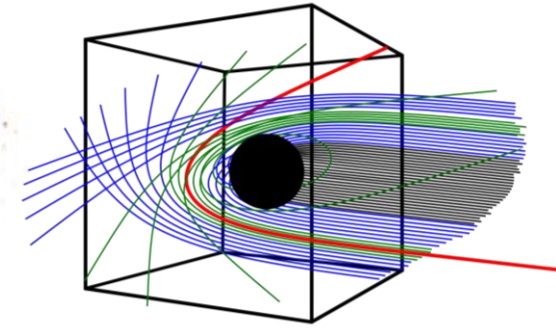
VLBA 3C345 reconstruction with CLEAN

Imaging 3D structure: BH-NeRF

3D Structure



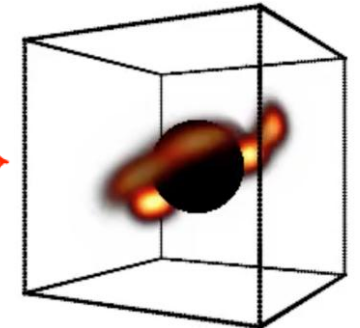
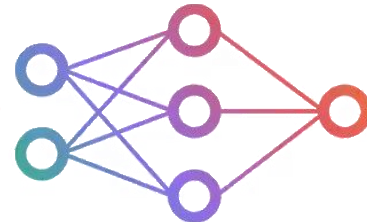
Physics



Implicit Regularization

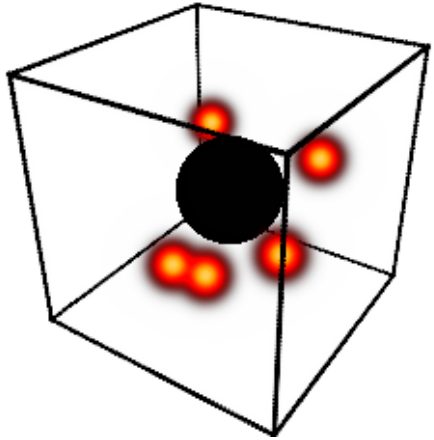
- Method to **reconstruct 3D emitting region** from EHT observations
- Builds in physical in lensing & synchrotron physics
- Uses a neural network as a model of 3D space with implicit regularization

X

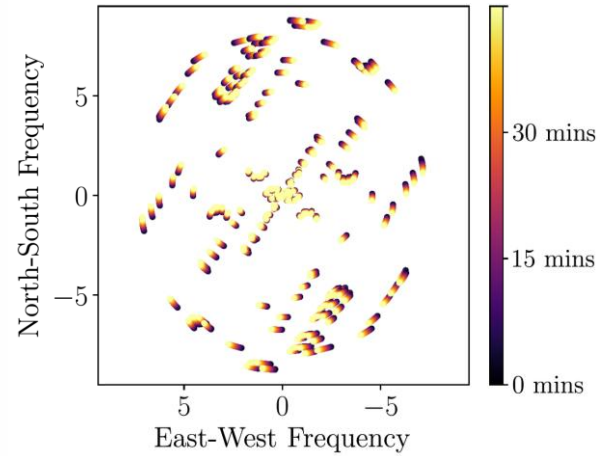
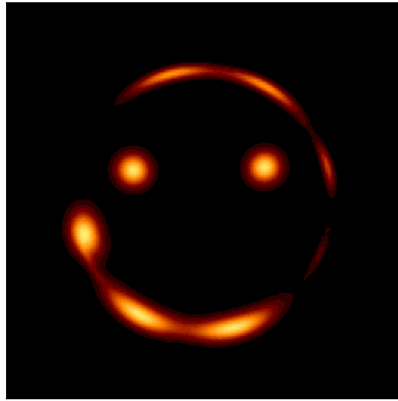


Imaging 3D structure: BH-NeRF

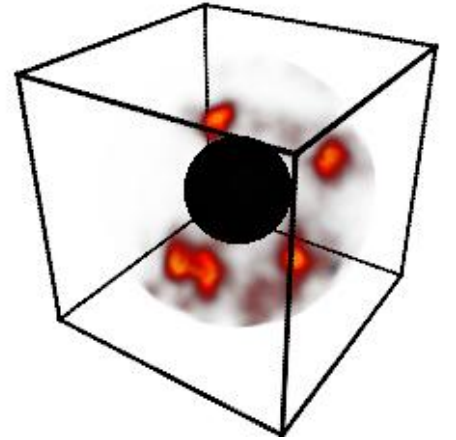
ground truth



40 minute coverage
(w/ ngEHT)



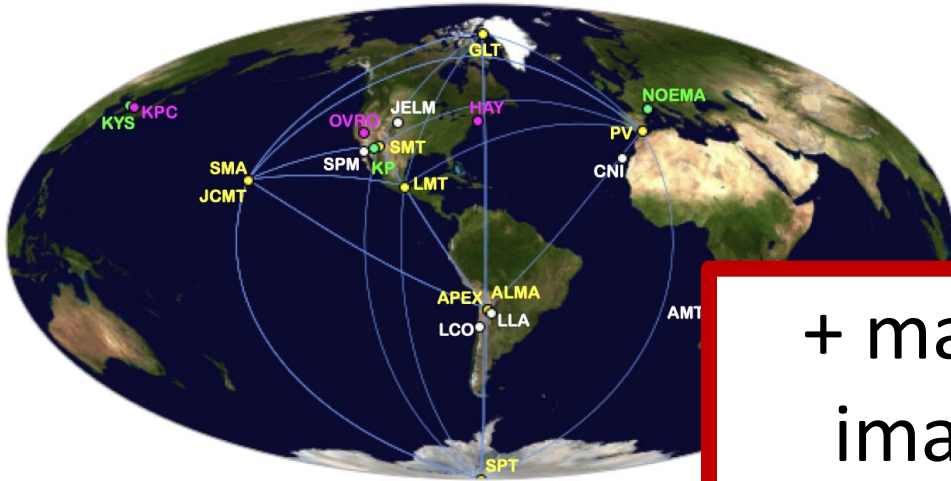
estimated



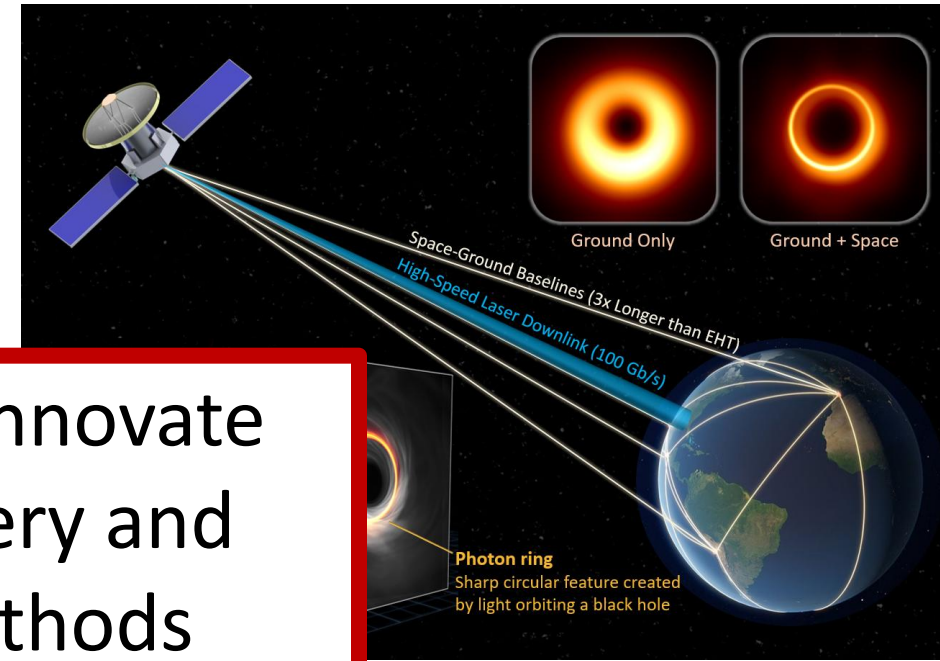
- Method to **reconstruct 3D emitting region** from EHT observations
- Builds in physical in lensing & synchrotron physics
- Uses a neural network as a model of 3D space with implicit regularization

The future of near-horizon black hole astrophysics

Expanded ground-based EHT array



Space VLBI / Black Hole Explorer (BHEX)



+ many new innovative
image recovery and
analysis methods

- Expand all EHT sites to multi-frequency observing and add 4-5 new stations (e.g. ngEHT concept, Doeleman+ 2023)
- Image black holes and AGN jets in **high dynamic range** at multiple frequencies
- Probe black hole jet launching from horizon to hundreds of Schwarzschild radii (e.g. Gelles+ 2024: [2410.00954](#))
- Make movies of Sgr A* and resolve black hole flares

- NASA SMEX proposal for a mmVLBI telescope in mid-earth orbit (Johnson+ 2024).
- Image black holes and other sources in **high resolution**
- Image extreme gravitational lensing and measure BH spin by resolving the **photon ring** (Lupsasca+ 2024).
- Expand number of horizon-scale sources from 2 to ~12 (Zhang+ 2024)

Takeaways...

1. **We can now regularly study black holes on the horizon scale** in exquisite detail by the Event Horizon Telescope
2. **The EHT has developed new imaging methods** to extract the most information we can from sparse, noisy images
3. **Rigorous validation and cross-comparison** between methods is essential for obtaining reliable images
4. **Polarization** is the key for constraining near-horizon astrophysics
5. **We are just getting started** in what we can learn from black hole images

...and more questions

- Can we measure black hole energy extraction in M87*?
- What plasma physics sets the temperature/distribution of the electrons?
- What powers flares in Sgr A* and M87*?
- What can EHT/BHEX observation tell us about the near-horizon environments of supermassive black holes beyond Sgr A* and M87*?

