

Supermassive Black Hole Discovery and Measurement with Triaxial Schwarzschild Modelling

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Slides at emilyliepold.com/today

The Big Picture

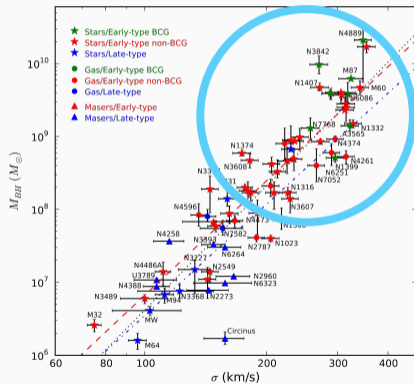
Triaxial Schwarzschild modelling!

First results! NGC1453 and NGC2693

M87

Motivation: What are we looking at?

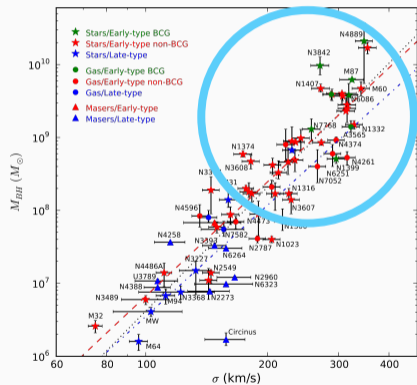
The MASSIVE Survey targets MASSIVE galaxies with MASSIVE black holes



(McConnell+Ma 2013)

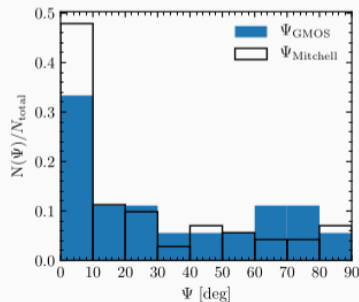
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The **MASSIVE** Survey targets **MASSIVE** galaxies with **MASSIVE** black holes



(McConnell+Ma 2013)

- These galaxies often have kinematic misalignments
- Kinematic misalignments strongly suggest a **triaxial** intrinsic shape (not axisymmetry!)



(Ene+20)

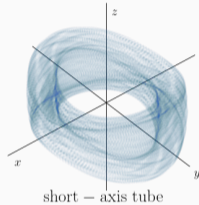
Motivation: Why do we care about the shape?

Shape of $\rho \rightarrow$ Shape of $\Phi \rightarrow$ Symmetries of $\Phi \rightarrow$ Conserved quantities and allowed orbits

Symmetry		Conserved Quantity	Orbits
Spherical	$\frac{d\Phi}{d\Omega} = 0$	(E, \vec{L})	Rosettes in fixed planes
Axisymmetry	$\frac{d\Phi}{d\phi} = 0$	(E, L_z, I_3)	Loops about symmetry axis
Triaxiality	Eh...	(E, I_2, I_3)	It's complicated...

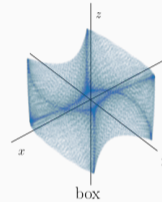
Some orbits in triaxial potentials are strange!

Loop Orbits



Appears in axisymmetric potentials

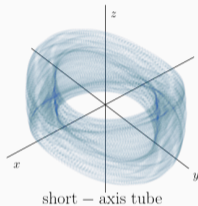
Box Orbits



Not present in axisymmetry!

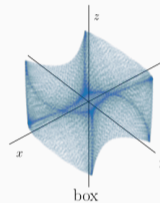
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Appears in axisymmetric potentials
Persistent sense of rotation about
either the **short** or **long** axis

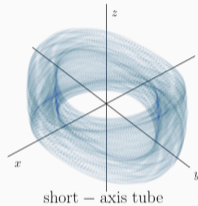
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Not present in axisymmetry!
No persistent sense of rotation

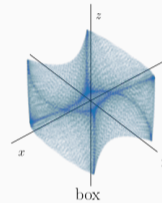
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Appears in axisymmetric potentials
Persistent sense of rotation about
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Centrophobic

Box Orbits



Not present in axisymmetry!
No persistent sense of rotation
Can be **Centrophilic**

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Strategy:

1. Propose a (triaxial) stellar density distribution
2. Integrate representative orbits that span the phase space
3. Superimpose those orbits such that (1) is reproduced

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4. Choose a superposition that **also** fits a set of kinematic observables
5. Repeat (1-4) with a bunch of different mass models

(Spawned from earlier code from van den Bosch+ 2008)

A **fortan**-based code for Schwarzschild orbit modelling in triaxial stellar potentials.

Model includes BH, stars, and dark matter halo:

$$\Phi = \Phi_{BH} + \Phi_* + \Phi_{DM}$$

Stellar kinematics (LOSVDs) described by Gauss-Hermite expansion with $y = (v - V)/\sigma$:

$$f(v) = \frac{e^{-\frac{v^2}{2}}}{\sqrt{2\pi\sigma^2}} \left[1 + \sum_{m=3}^n h_m H_m(y) \right]$$

2D (projected) and 3D (intrinsic) mass distributions are constrained for self-consistency.

Each **TriOS** model gives a χ^2 value for a single point in the parameter-space

- We need to search over M_{BH} , M/L (1 or 2 parameters), shape (3 parameters), and halo (1 or 2 parameters) – at least **6-8 dimensions**. (Grid Searches are inefficient)

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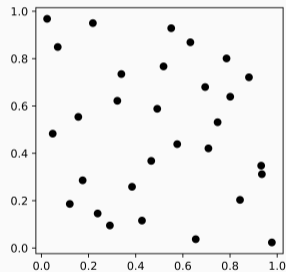
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- As data improves, confidence volumes **shrink** with $\sim (\text{Number of Constraints})^{-D/2}$

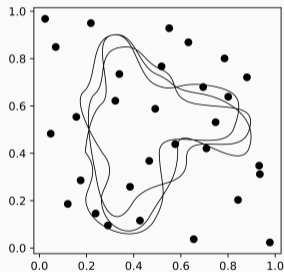
Our Strategy (inspired by Bayesian Optimization and nested sampling):

1. Sparsely populate the space



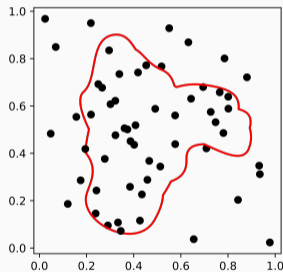
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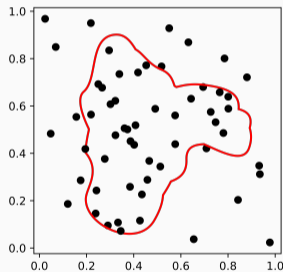
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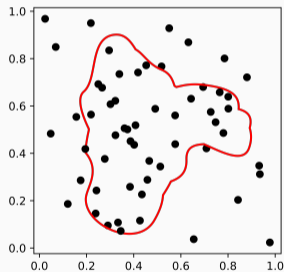
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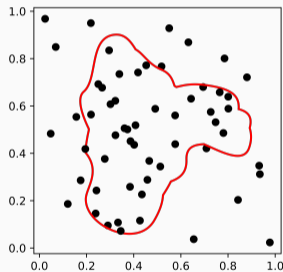
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 - (We've been averaging 1.5M CPU-hours / year on Expanse at SDSC)



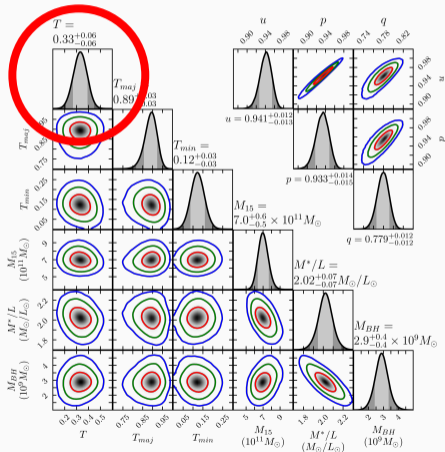
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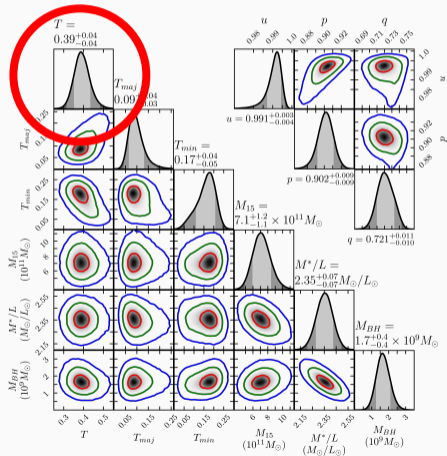
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NGC1453

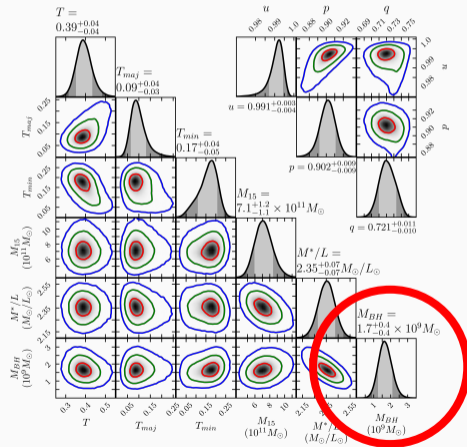
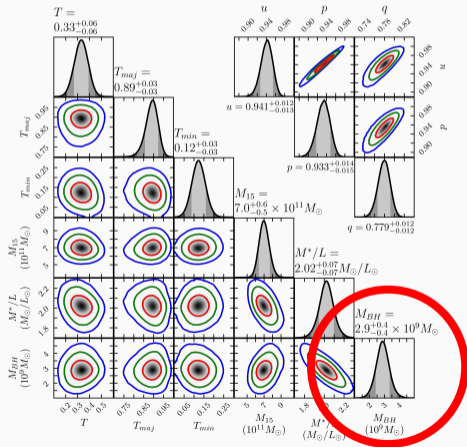


NGC2693



NGC1453

NGC2693



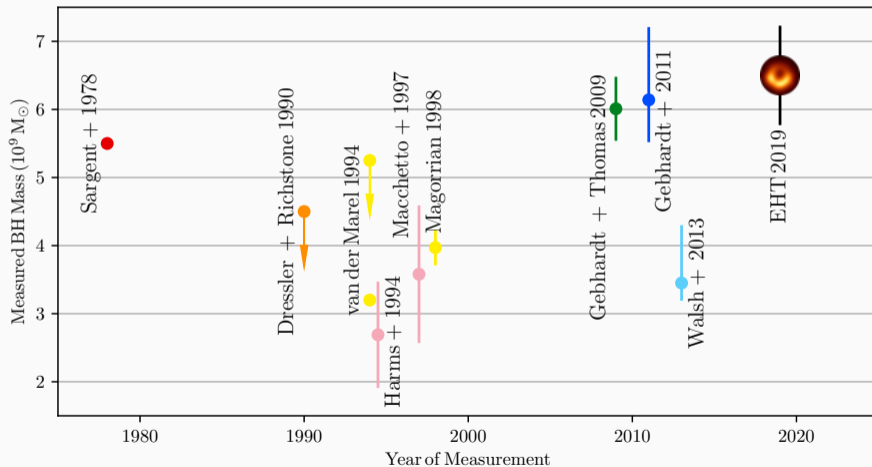
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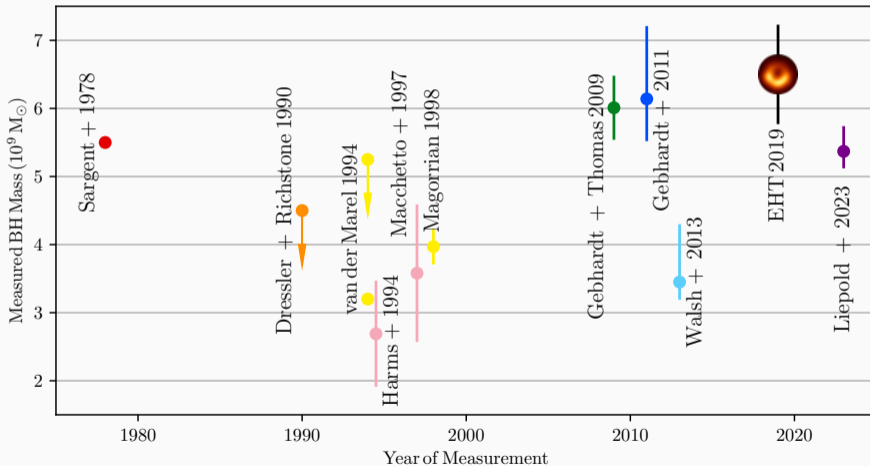
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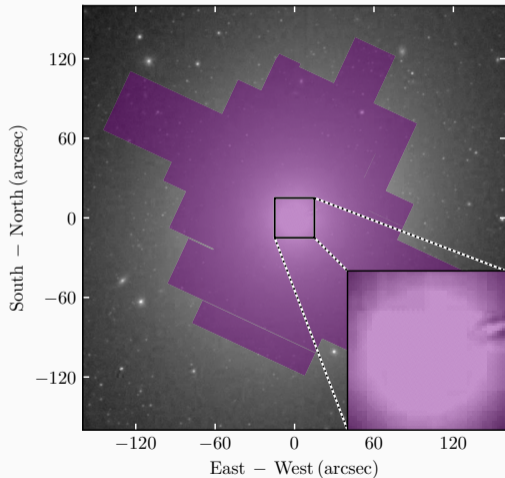
M87

M87* has a *long* history

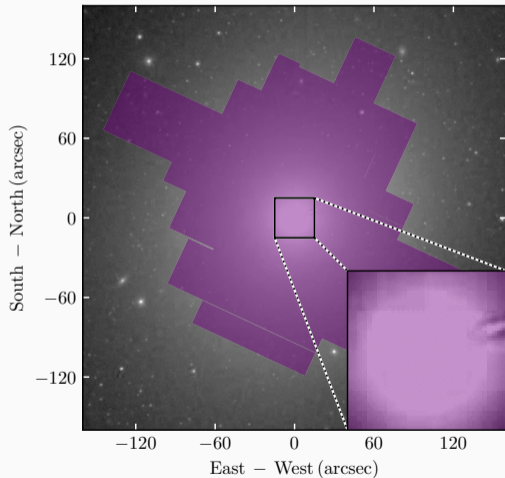


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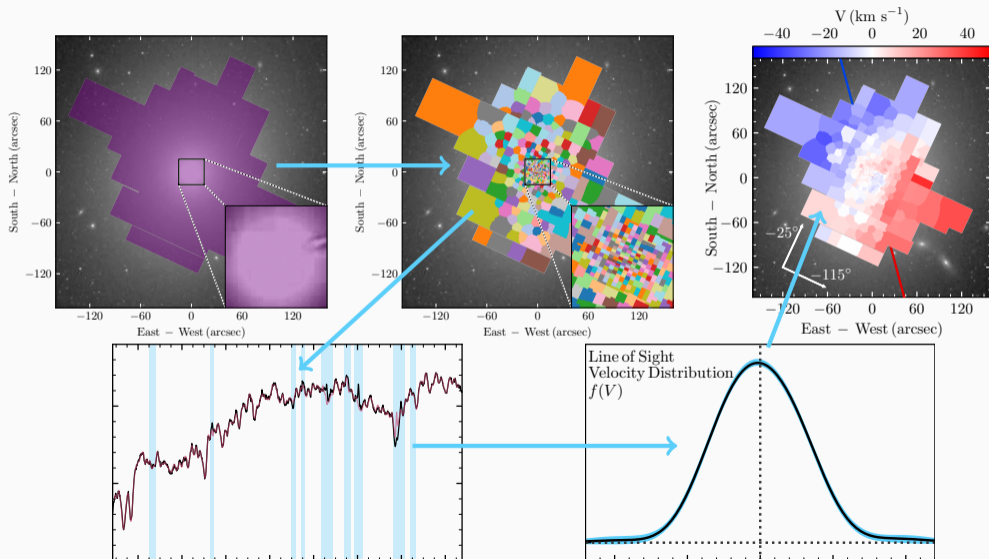


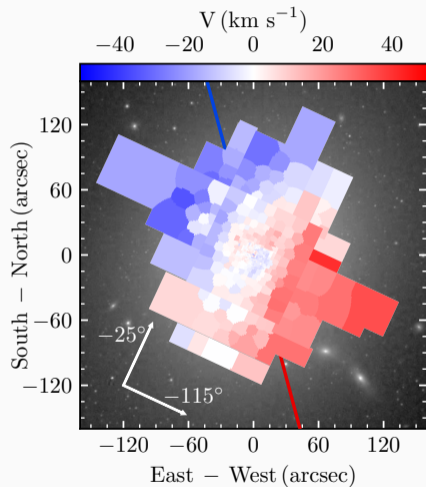


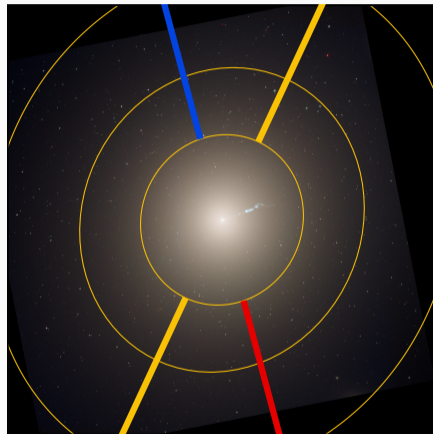
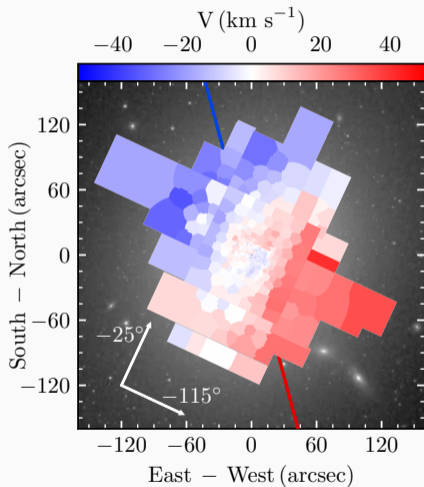
- We observed M87 with Keck Cosmic Web Imager (KCWI) during four observing runs from May 2020 - April 2022.
- This is an integral field unit, yielding a distinct spectrum at each spatial pixel.

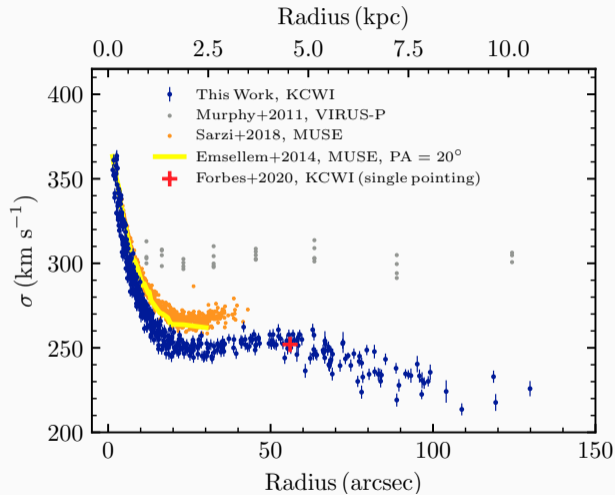
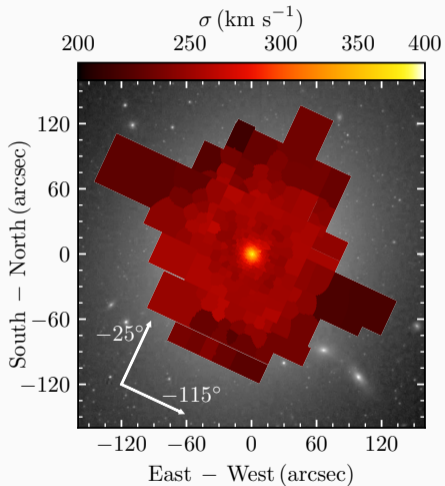


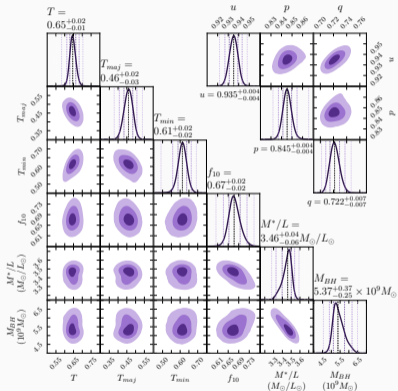
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- This is an integral field unit, yielding a distinct spectrum at each spatial pixel.
- 62 pointings were observed, each corresponding to a $20.4'' \times 33''$ FOV with $0.3'' \times 1.4''$ spatial pixels
- The full FOV spans about $250''$ along the photometric major axis and $300''$ along the minor (11.6 square arcmin in total!)











M87 Property (units)

Inferred value

Black hole mass M_{BH} ($10^9 M_{\odot}$)

$5.37^{+0.37}_{-0.25} \pm 0.22$

Inner M^*/L (V-band; M_{\odot}/L_{\odot})

$8.65^{+0.10}_{-0.15} \pm 0.38$

Dark matter fraction at 10 kpc f_{10}

0.67 ± 0.02

Shape parameter T

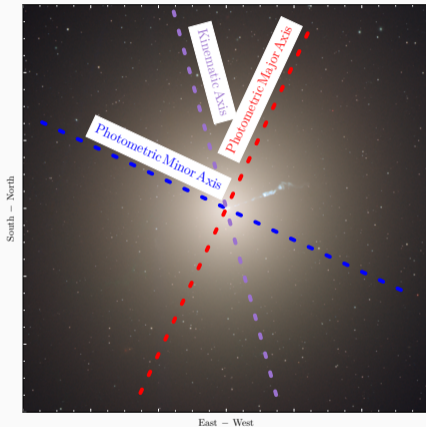
0.65 ± 0.02

Average middle-to-long axis ratio p

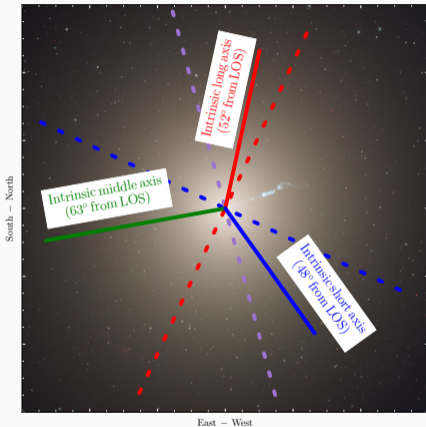
0.845 ± 0.004

Average short-to-long axis ratio q

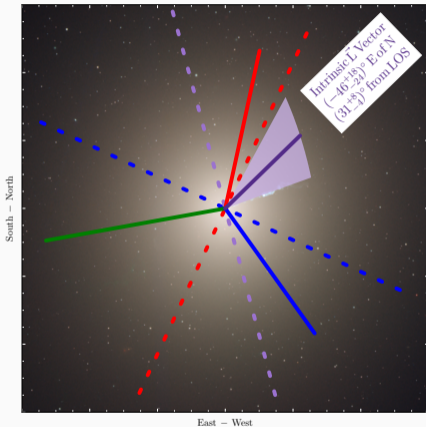
0.722 ± 0.007



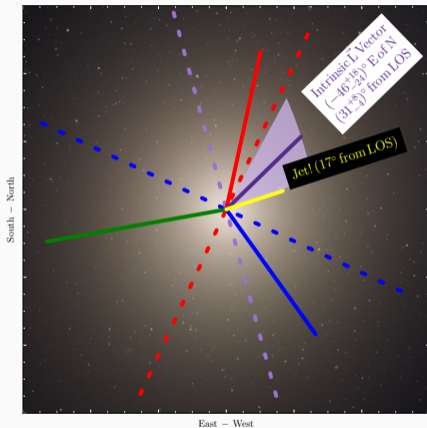
	PA on Sky (° E of N)	Angle from Line of Sight
Photometric Major Axis	-25°	—
Photometric Minor Axis	+65°	—
Kinematic Axis	-165°	—



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Intrinsic \vec{L} Vector (between 80" and 150")	$(-46^{+17}_{-24})^\circ$	$(31^{+7}_{-4})^\circ$

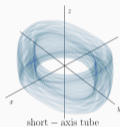
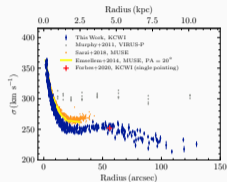
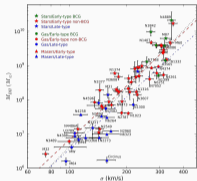


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	Jet!	17°

The intrinsic angular momentum axis of M87's stellar component is only $(17^{+11}_{-7})^\circ$ from the jet!

Thank you! (Questions?)

Looking Backward



Looking Forward

- SUPER-MASSIVE galaxies with huge central cores
- JWST M87 data in 30 ± 27 days
- TriOS 2.0!

