



Introduction to Imaging Stellar Surfaces

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51 Peg b Fellow
University of Michigan

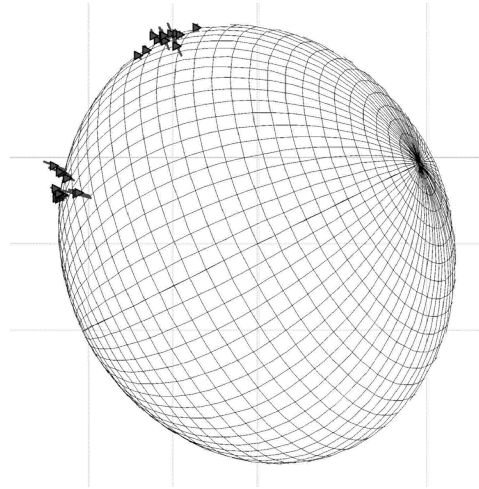
Ryan Norris

New Mexico Institute
of Mining and
Technology



Rapid Rotators

Altair

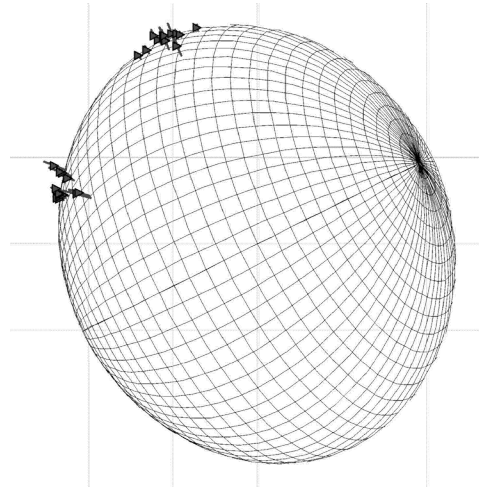


van Belle et al. 2001

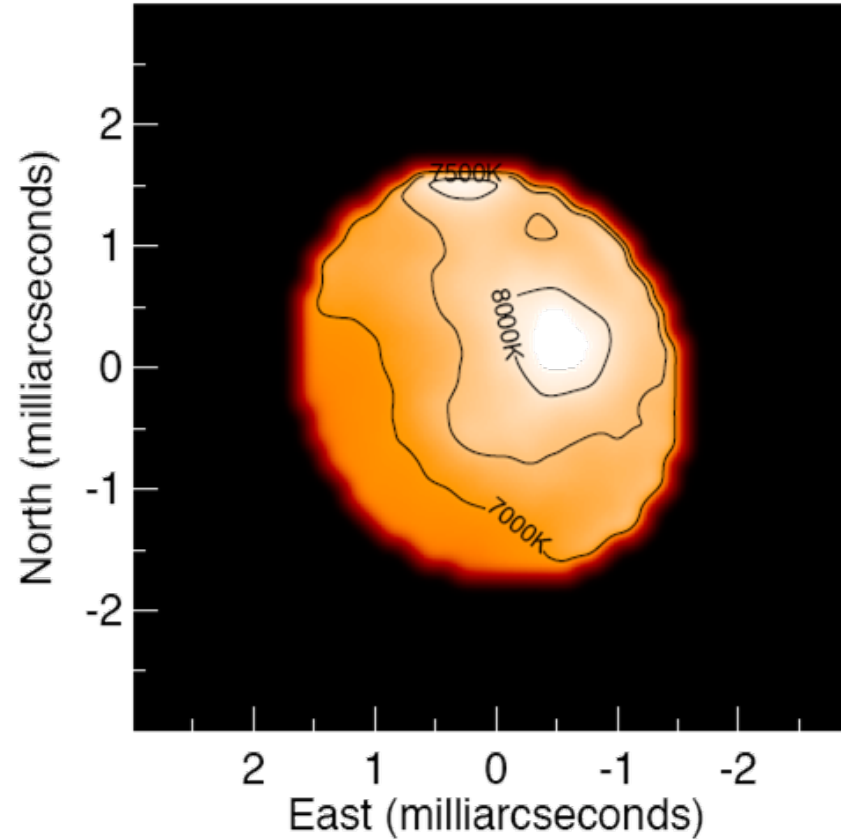


Rapid Rotators

Altair



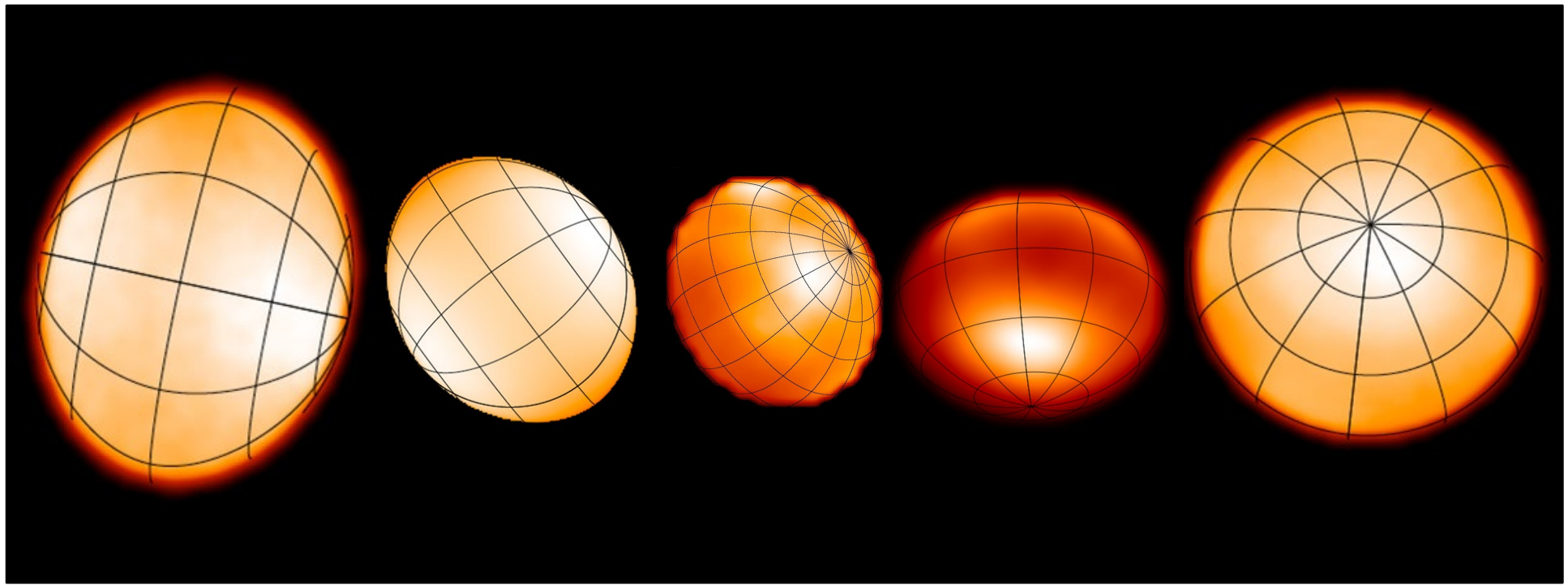
van Belle et al. 2001



Monnier et al. 2007



Rapid Rotators



2 R_{sun}

Regulus

Rasalhague

Altair

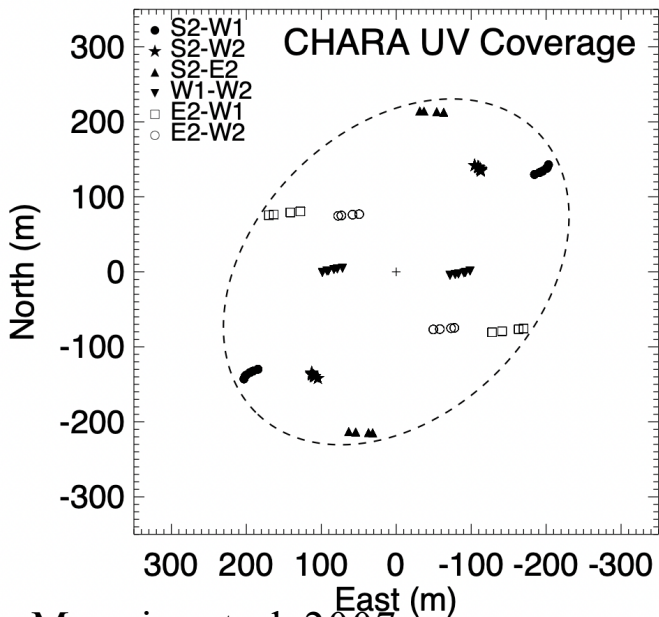
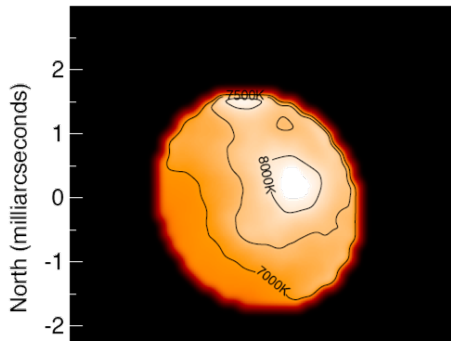
Alderamin

β Cas

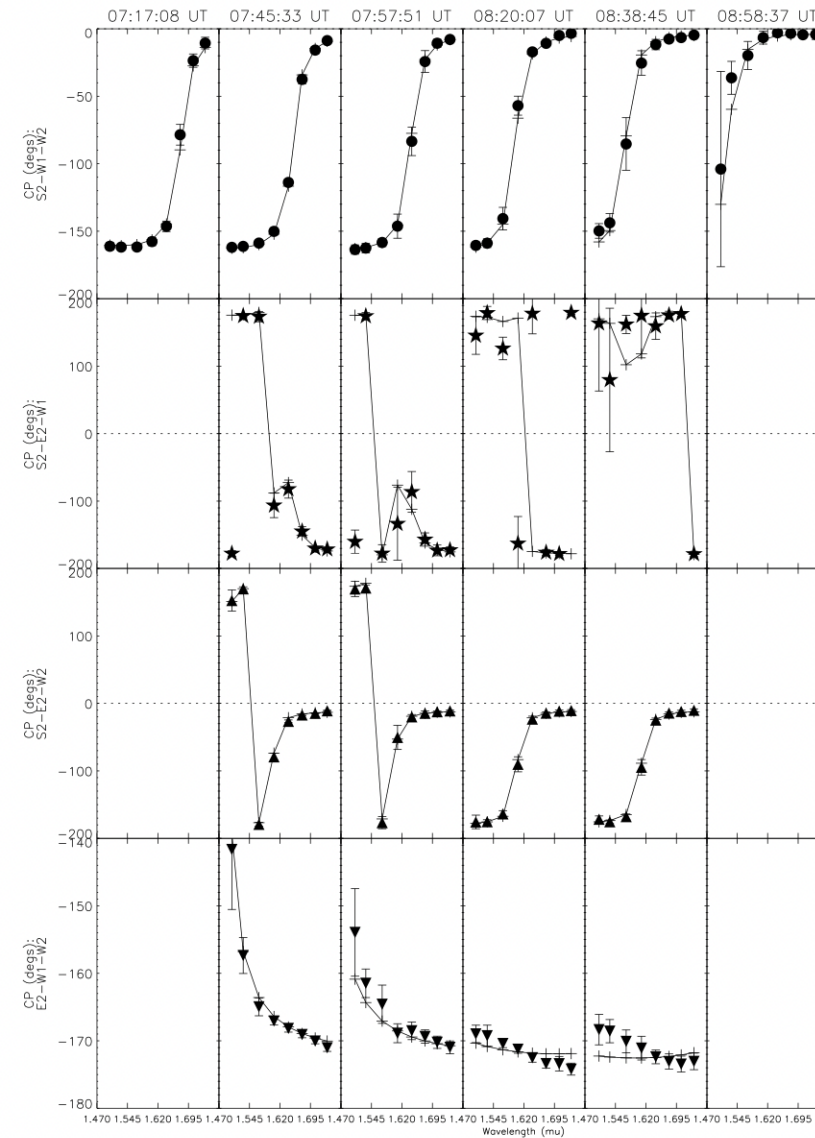
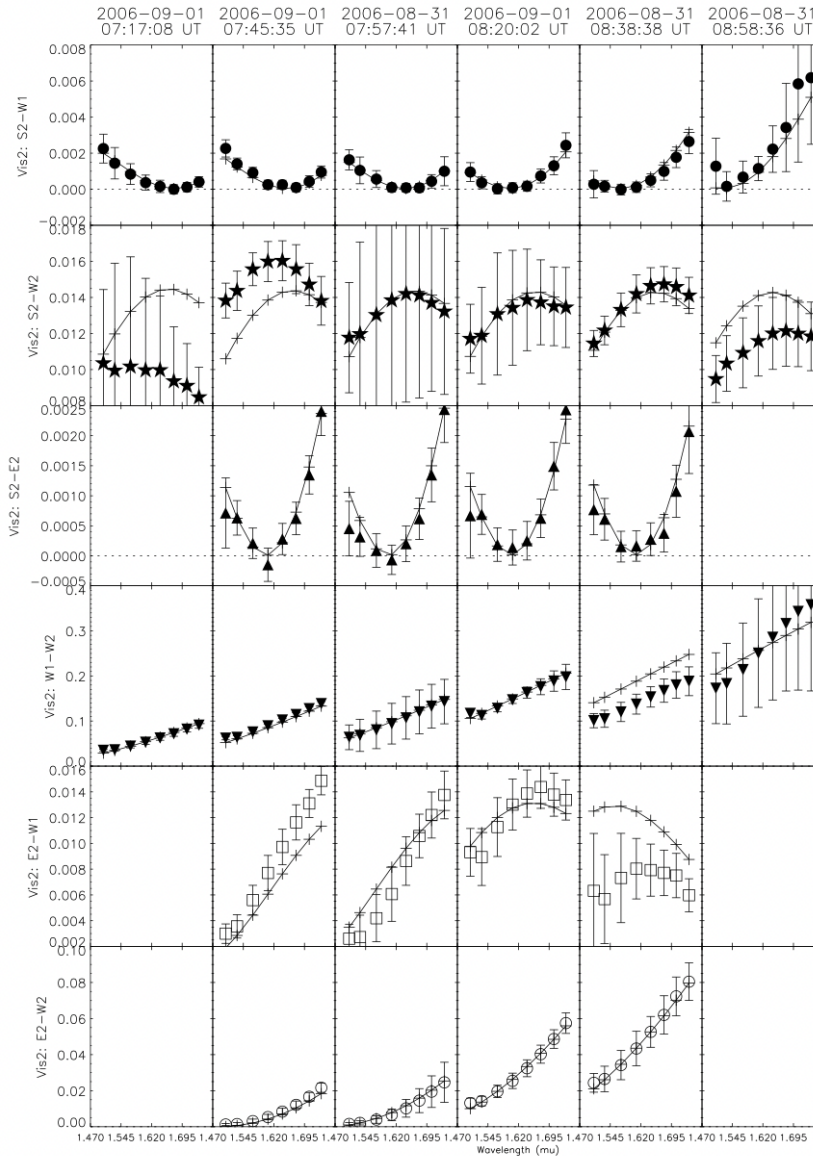
From review by Ming



Altair



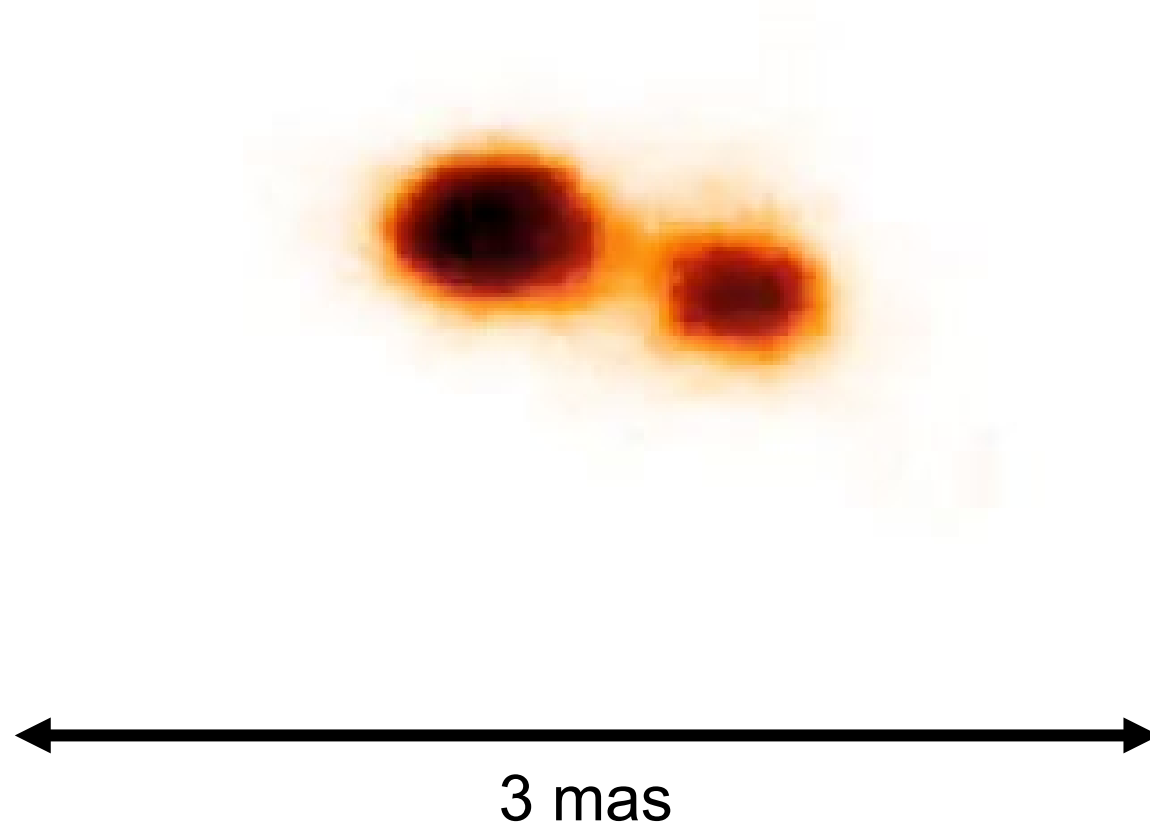
Monnier et al. 2007





Interacting Binaries

β Lyrae

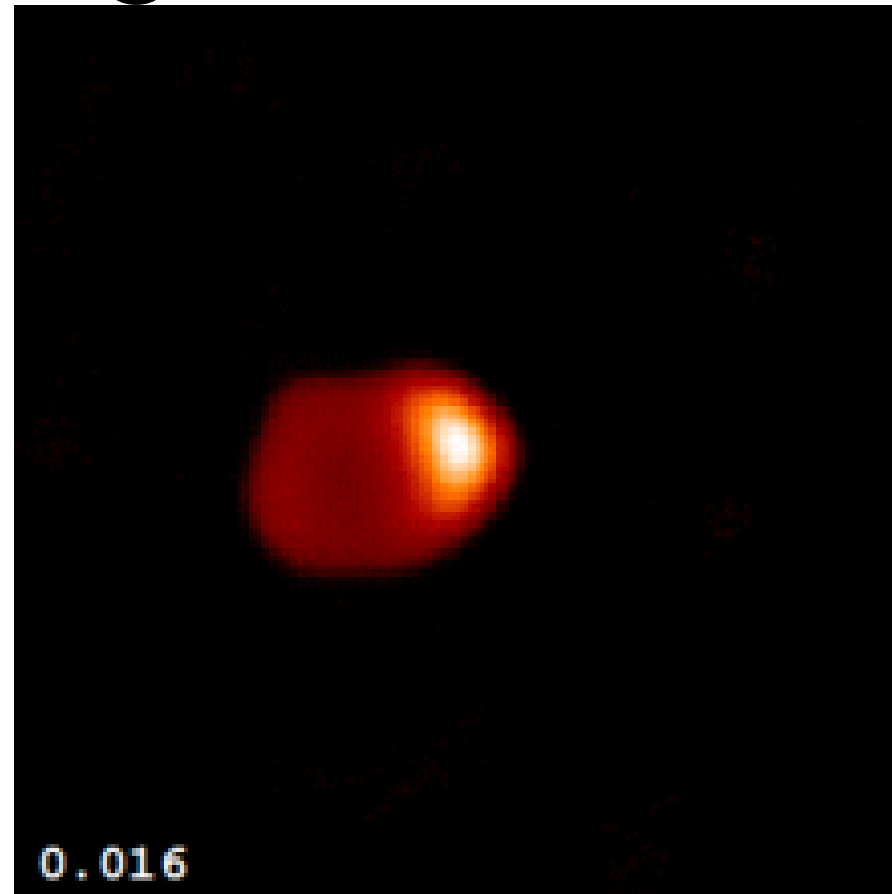


Zhao et al. 2008



Interacting Binaries

Algol



0.016

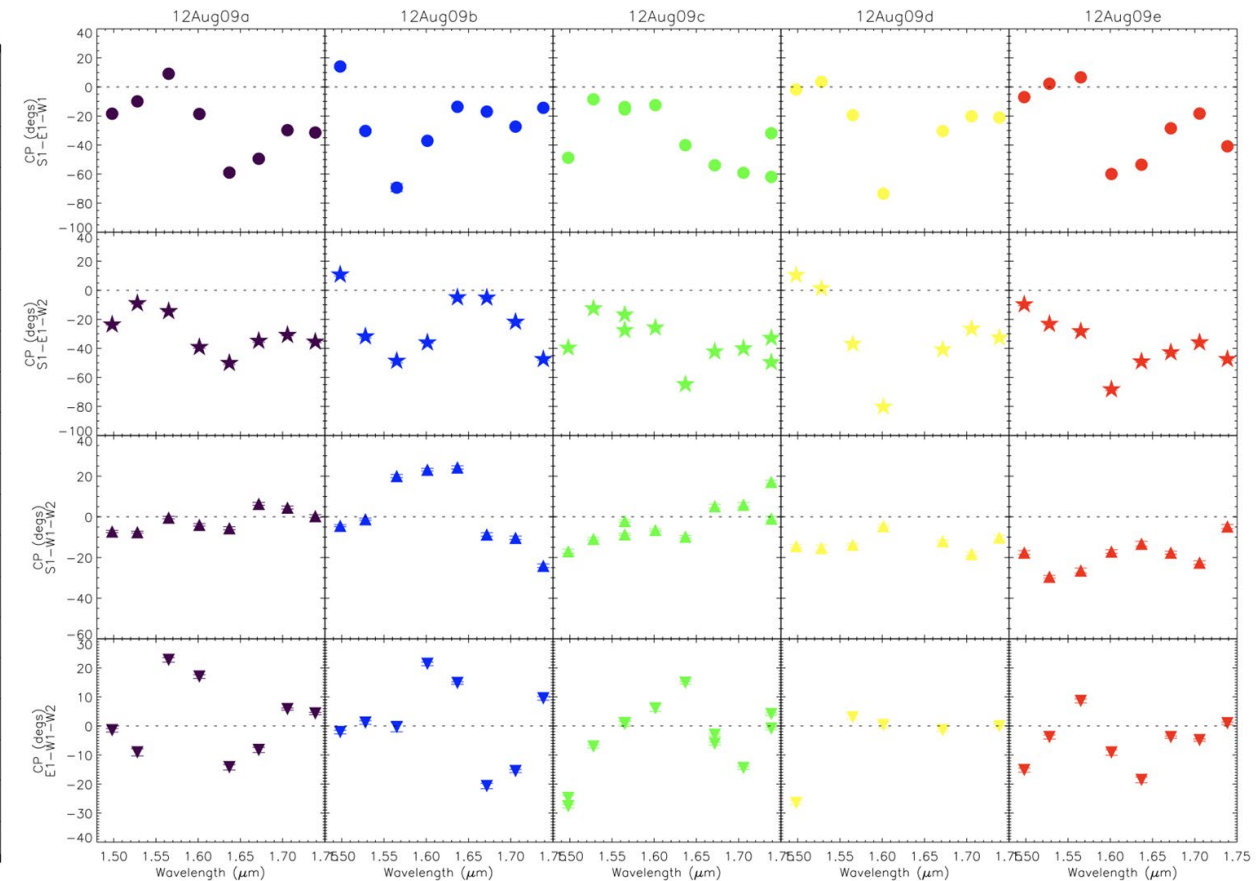
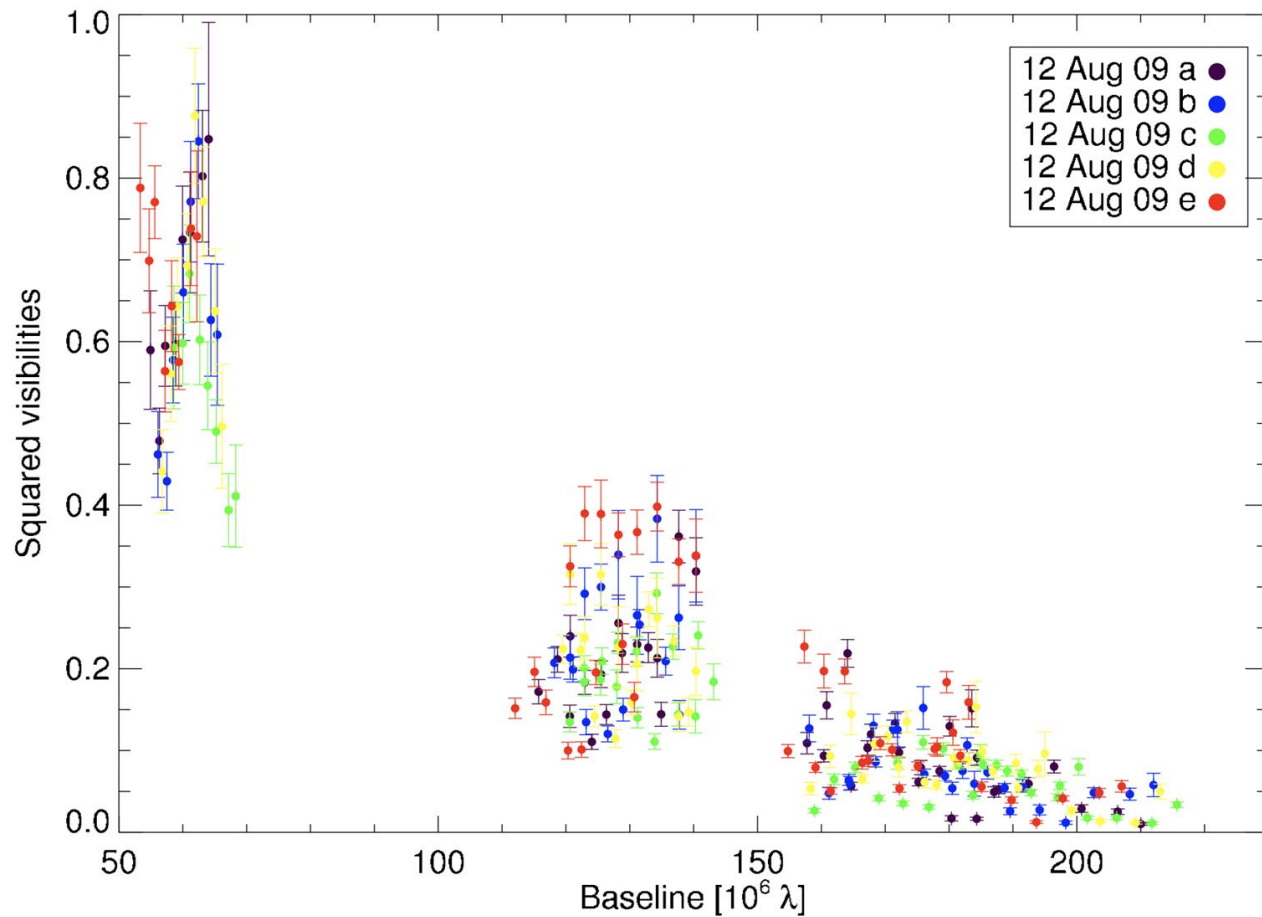


9 mas

Baron et al. 2012



Algo1

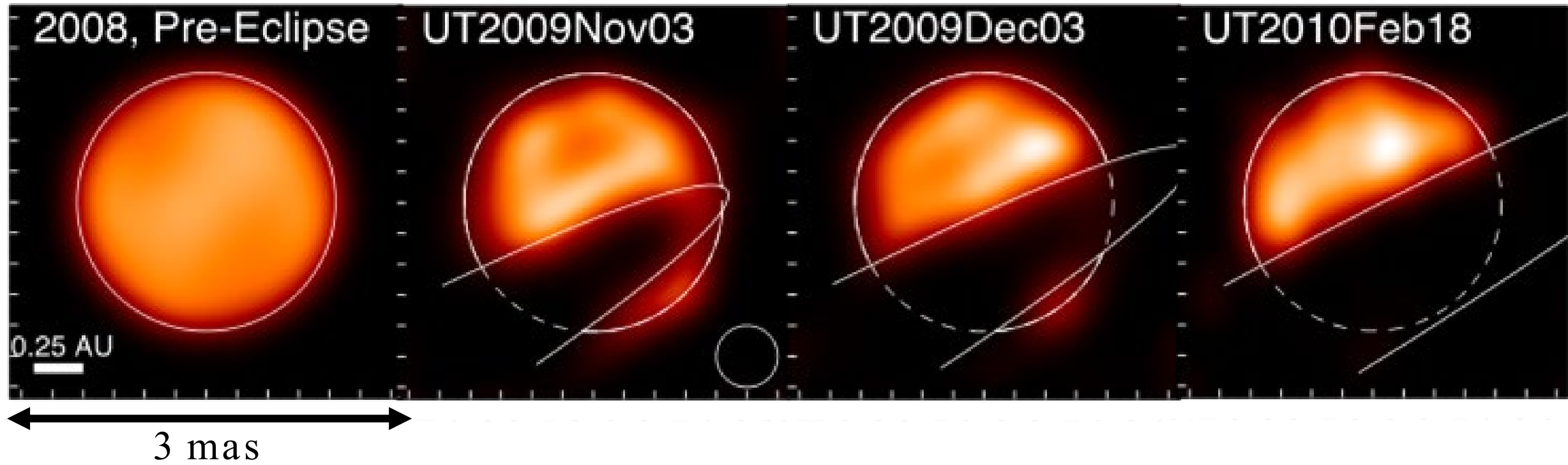


Baron et al. 2012



Transiting Disk

ϵ Aur

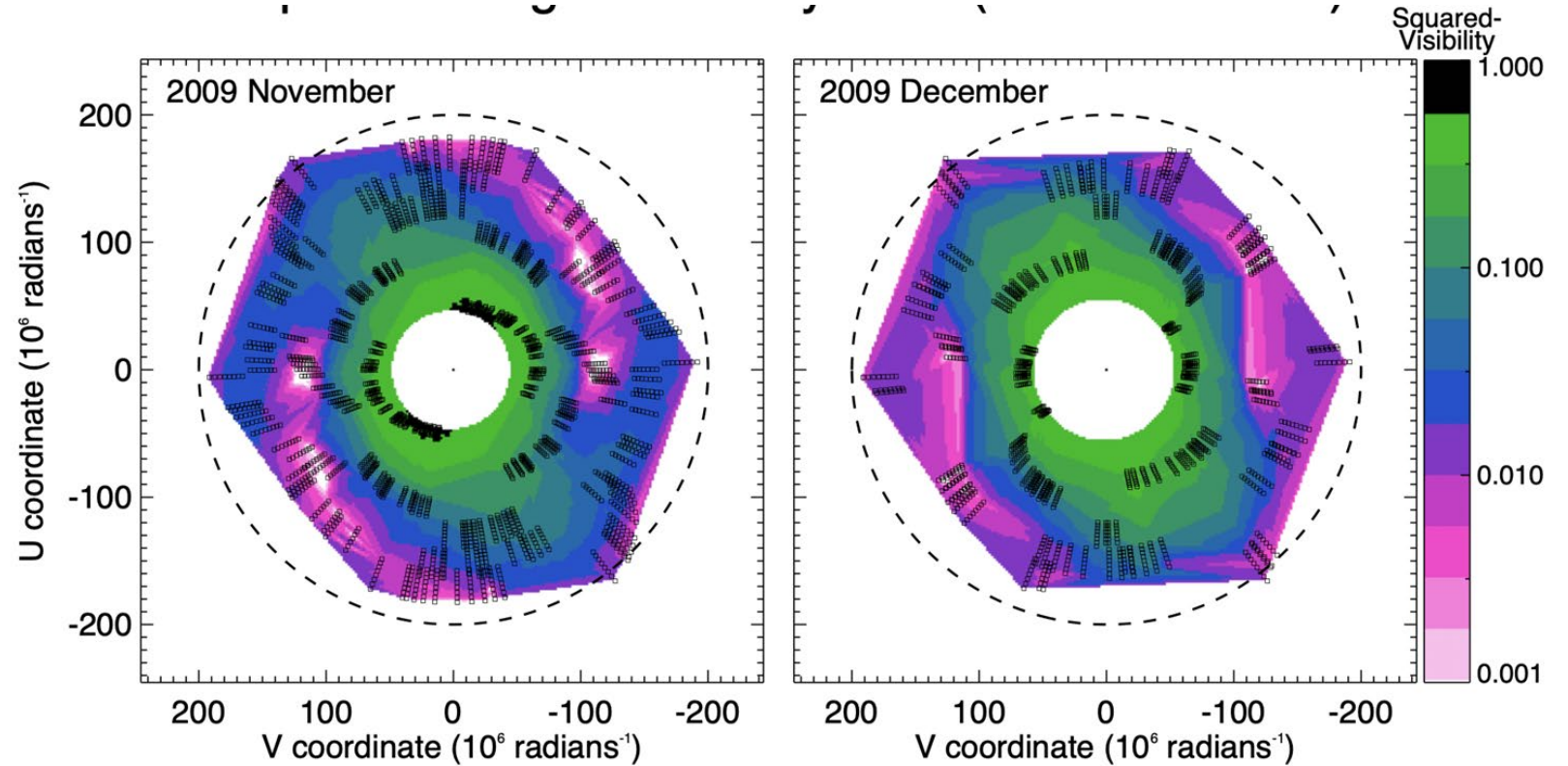
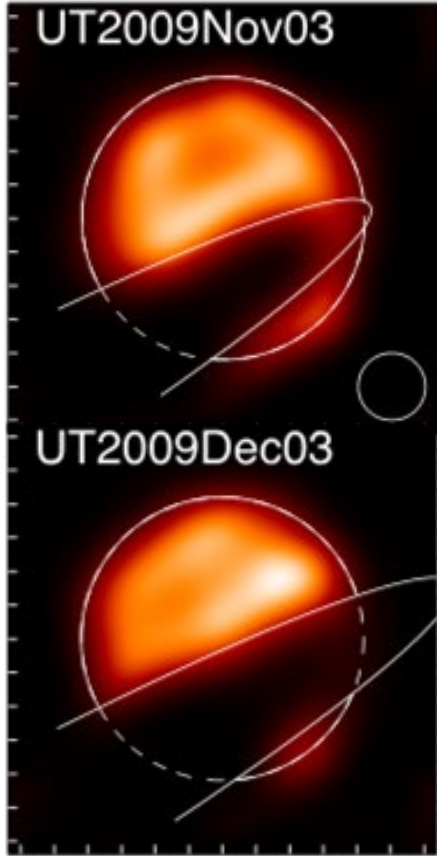


Kloppenborg et al.



Transiting Disk

ϵ Aur

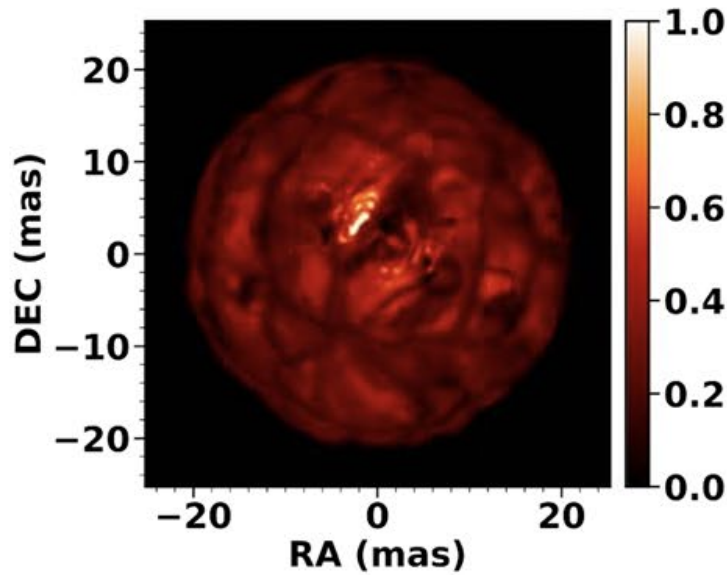


Kloppenborg et al.
2010

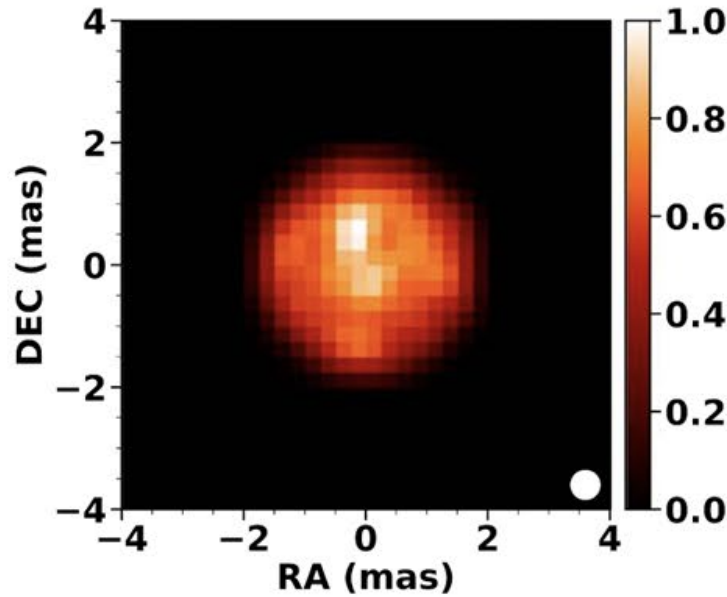


Supergiants

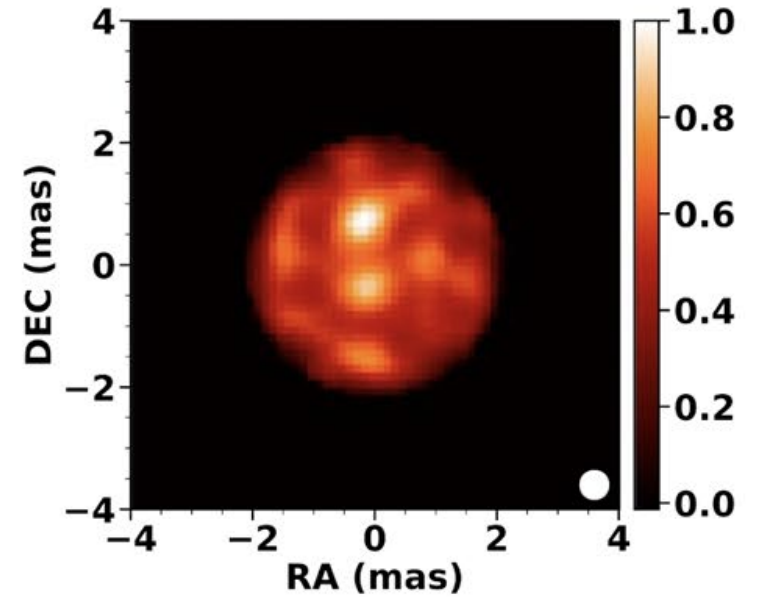
AZ Cyg



Unconvolved Source Image



Scaled down, convolved Source Image



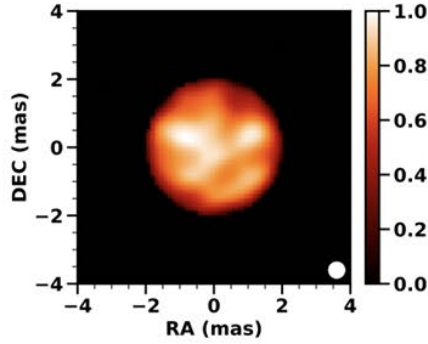
Best fitting reconstruction

Norris et al. 2021

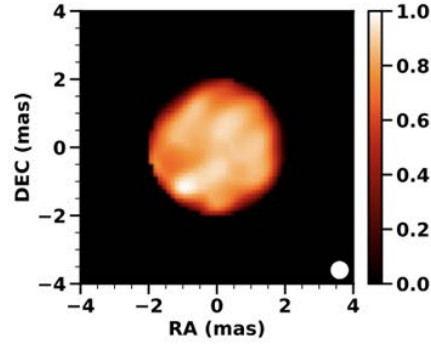


Supergiants

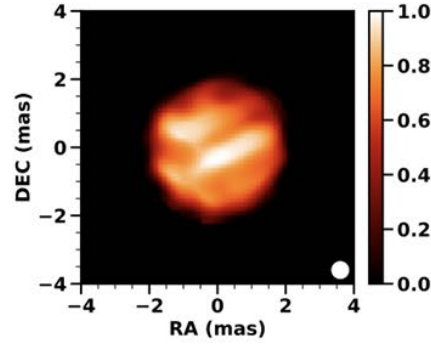
AZ Cyg



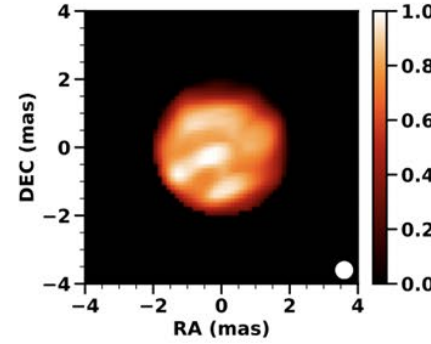
AZ Cyg (OITools.jl) 2011



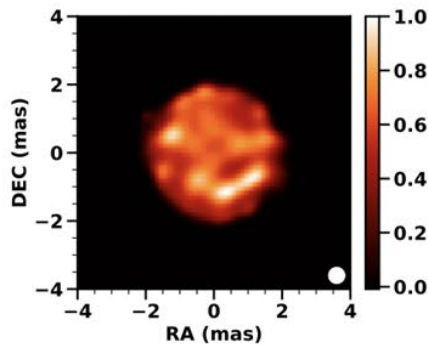
AZ Cyg (OITools.jl) 2014



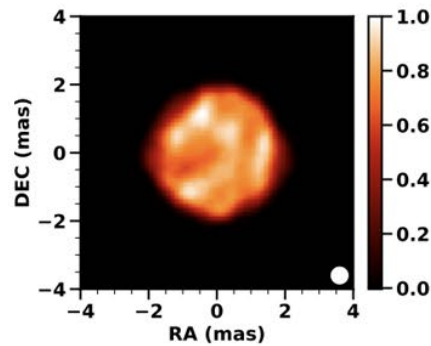
AZ Cyg (OITools.jl) 2015



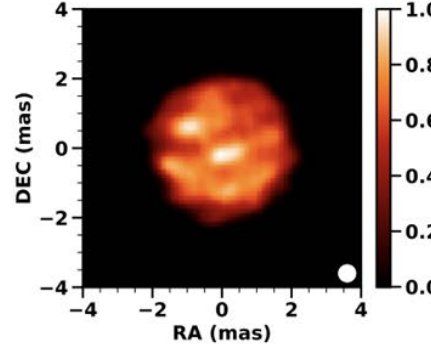
AZ Cyg (OITools.jl) 2016



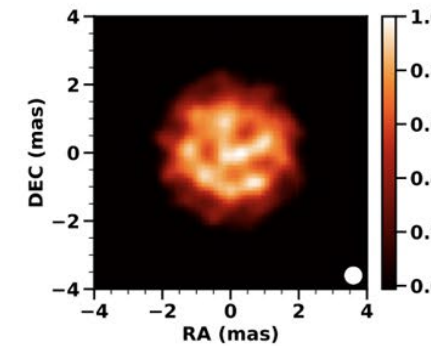
AZ Cyg (SQUEEZE) 2011



AZ Cyg (SQUEEZE) 2014



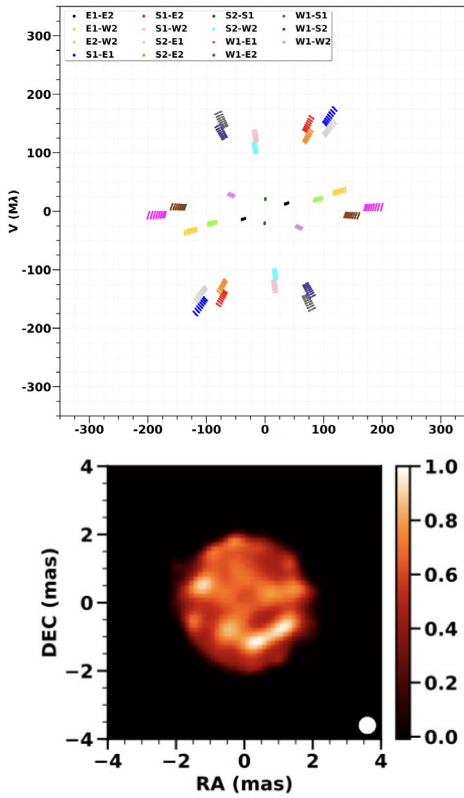
AZ Cyg (SQUEEZE) 2015



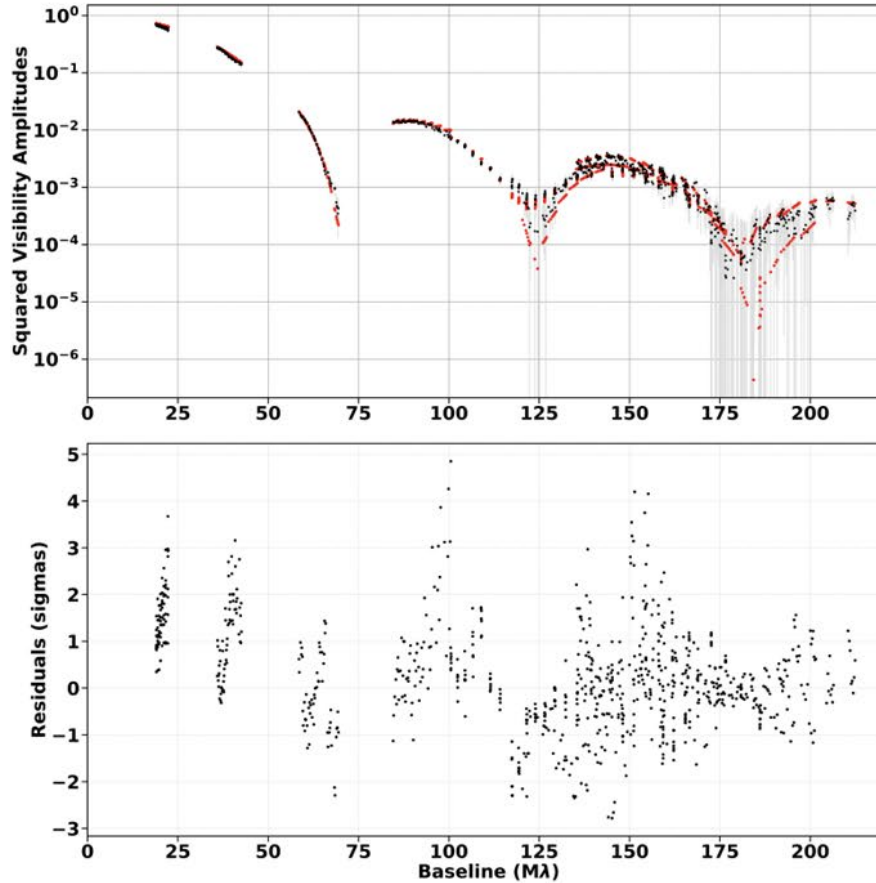
AZ Cyg (SQUEEZE) 2016 Norris et al. 2021



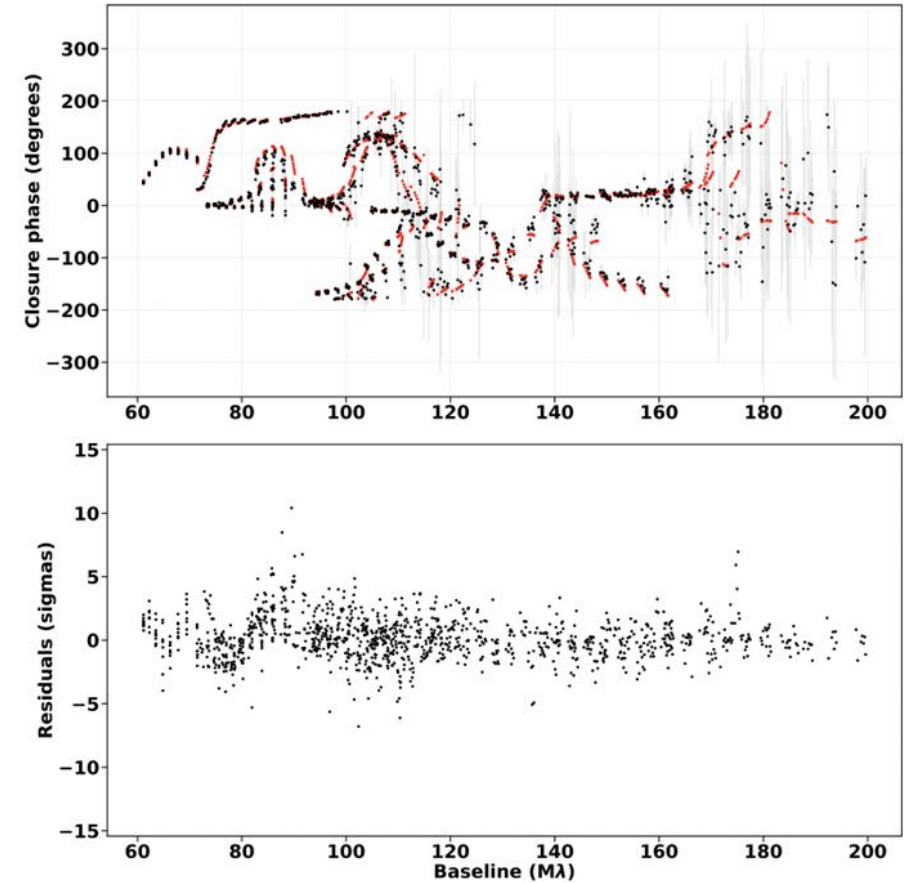
AZ Cyg



AZ Cyg (SQUEEZE) 2011



AZ Cyg 2011 Squared Visibilities

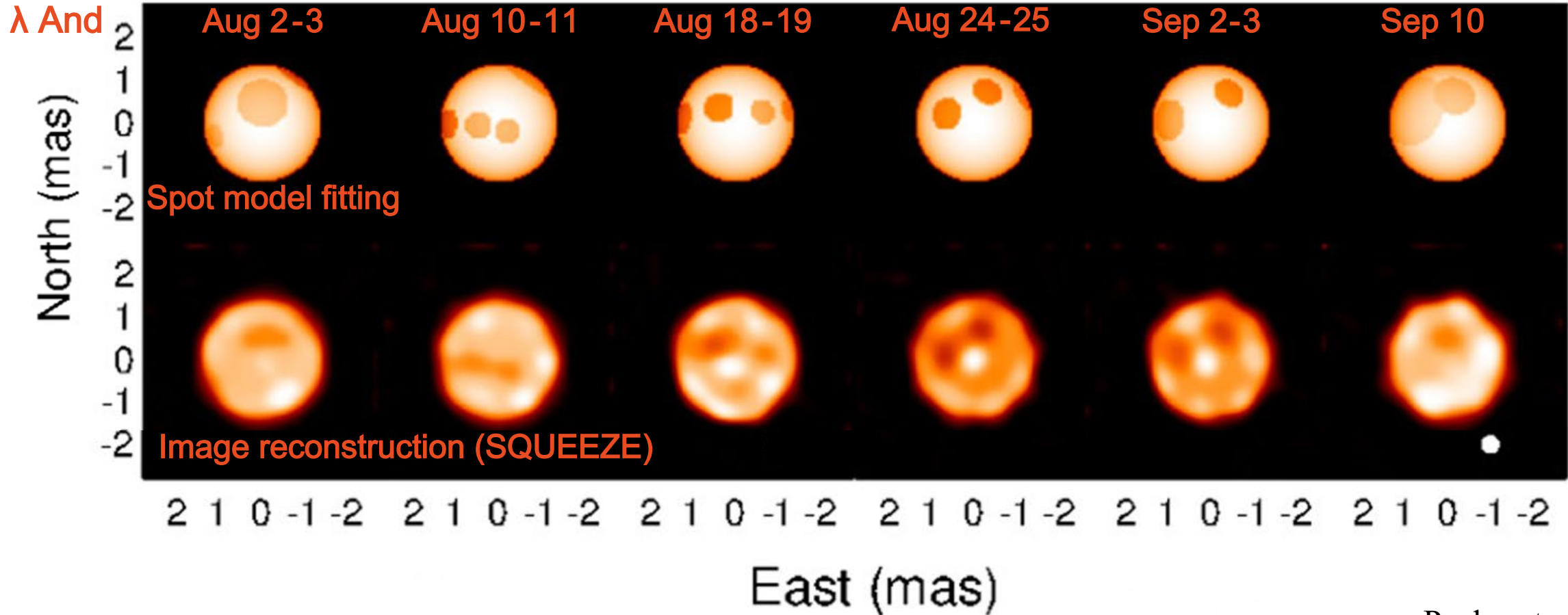


AZ Cyg 2011 Closure Phases

Norris et al. 2021



Starspots - Snapshot Imaging



Parks et al. 2021



Model fitting

Aug 2-3

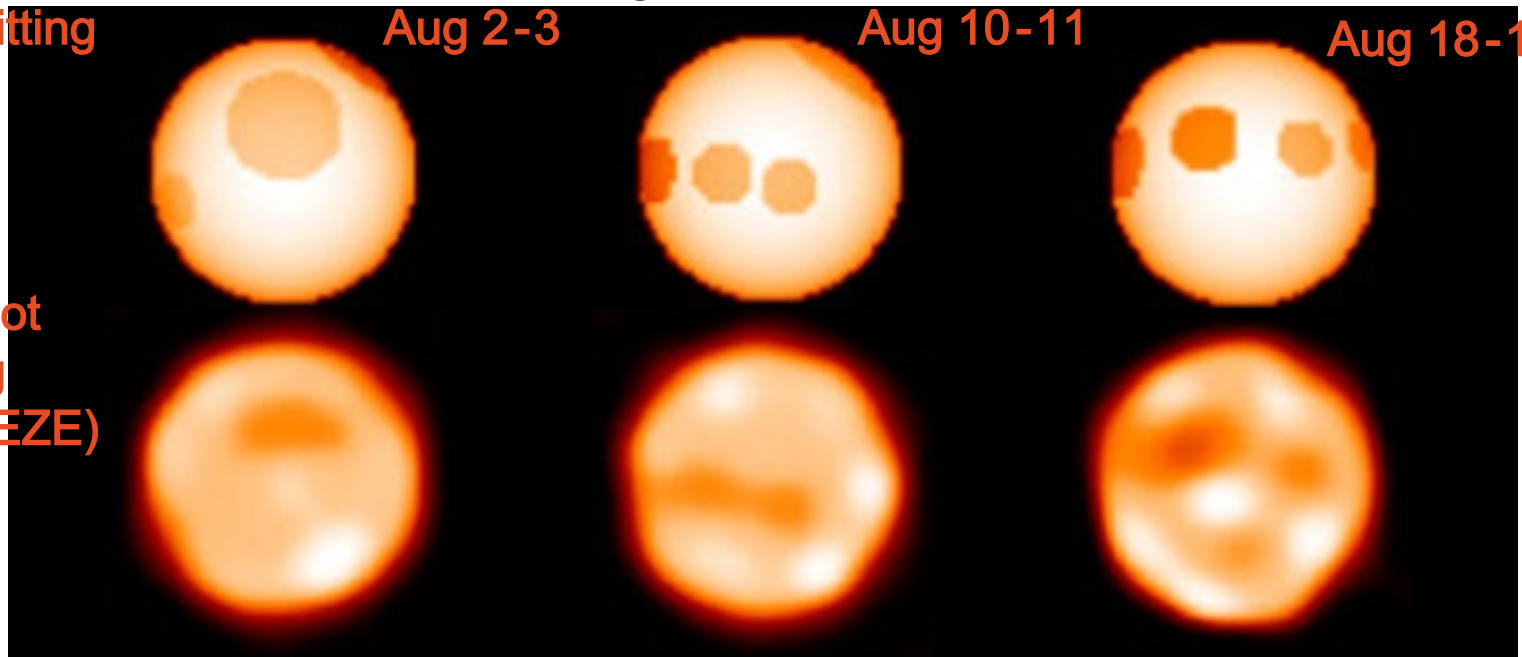
Aug 10-11

Aug 18-19

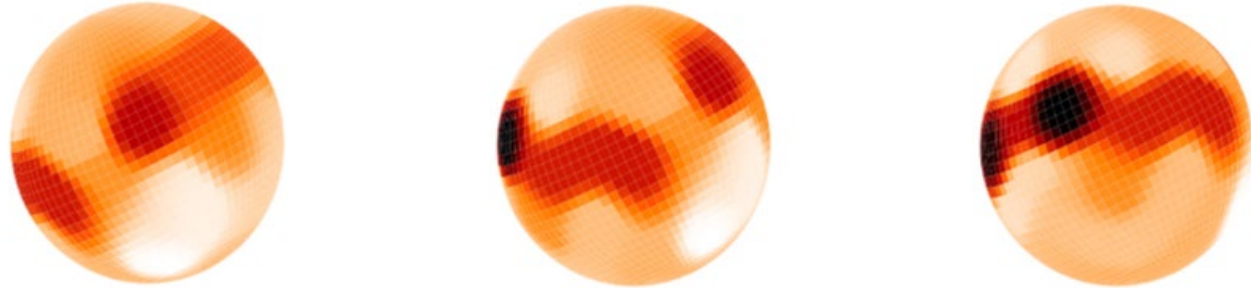
Starspots

λ And

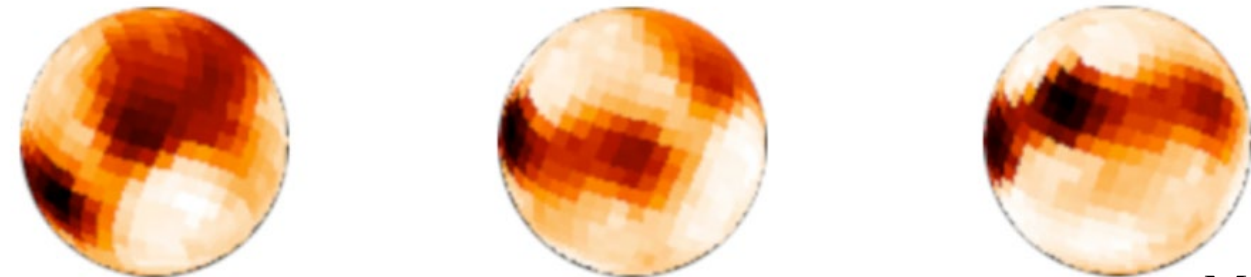
Snapshot imaging (SQUEEZE)



Imaging on a sphere (ROTIR)



Imaging on a sphere (SURFING)

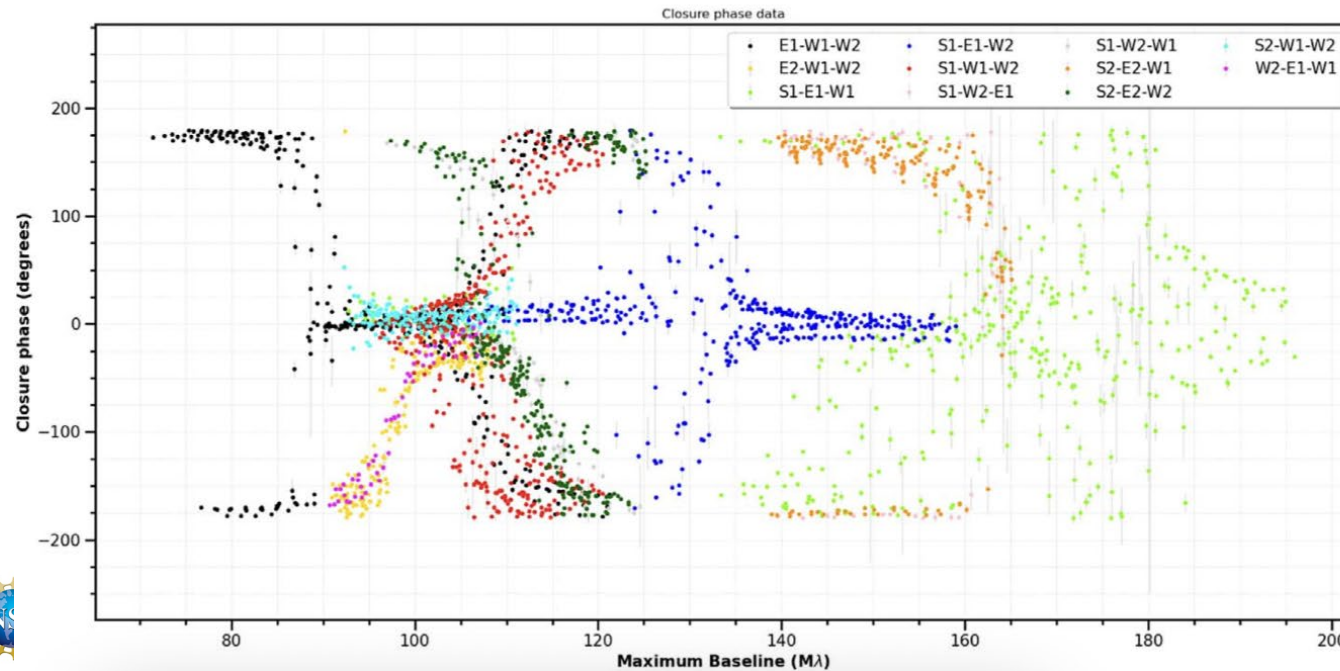
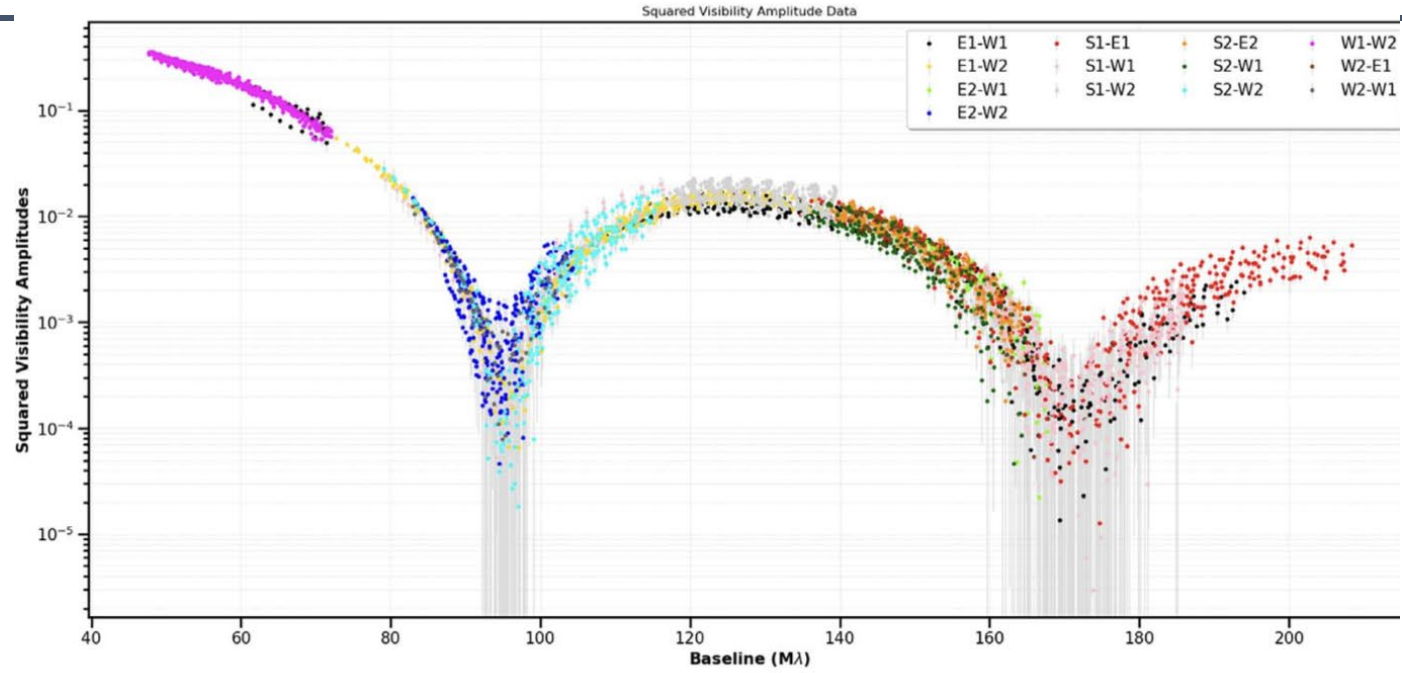
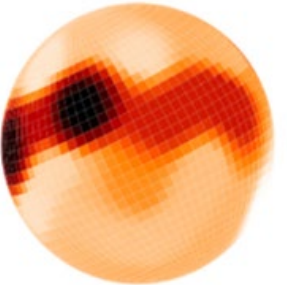
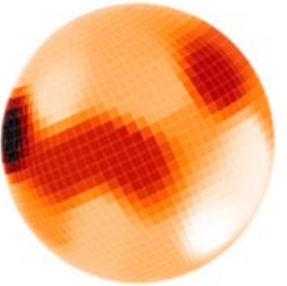
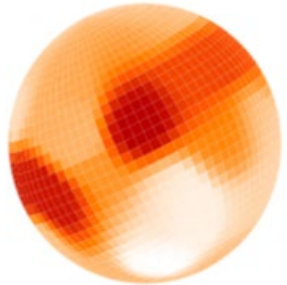


Parks et al. 2021
Martinez et al. 2021



λ And

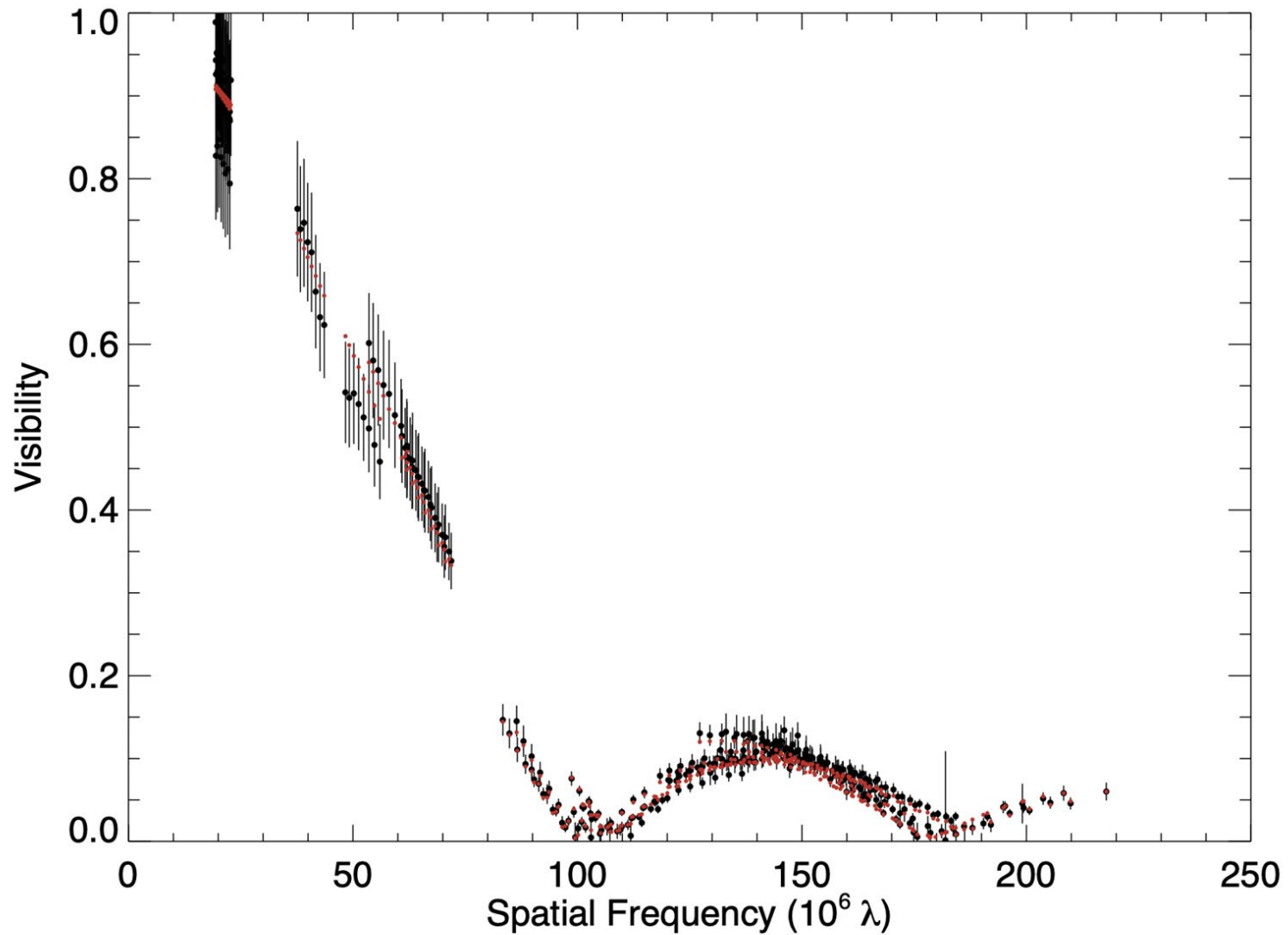
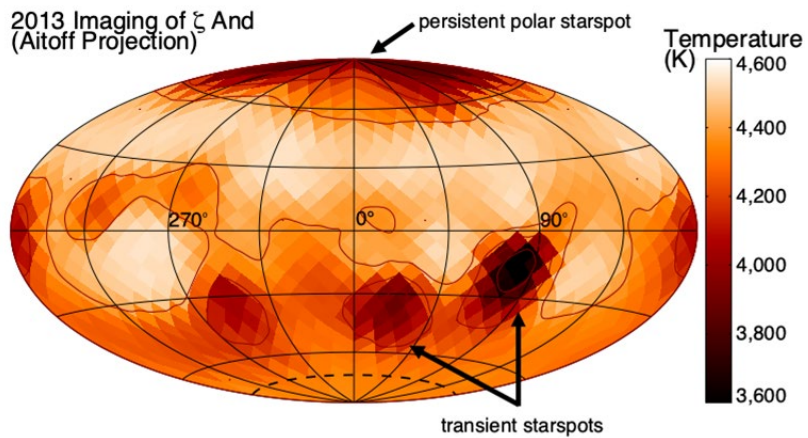
19 4T epochs





ζ And

2013 Imaging of ζ And (Aitoff Projection)

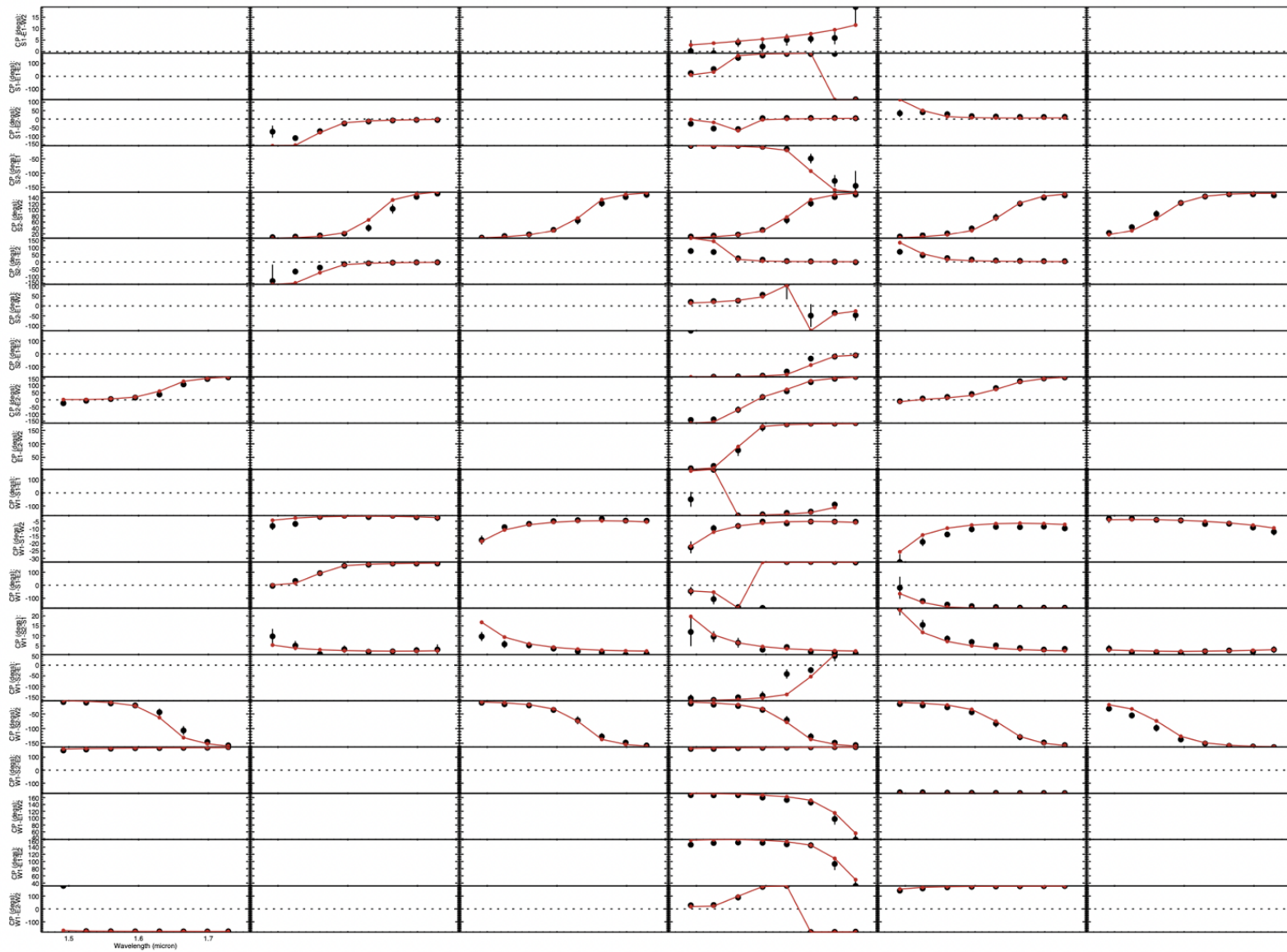
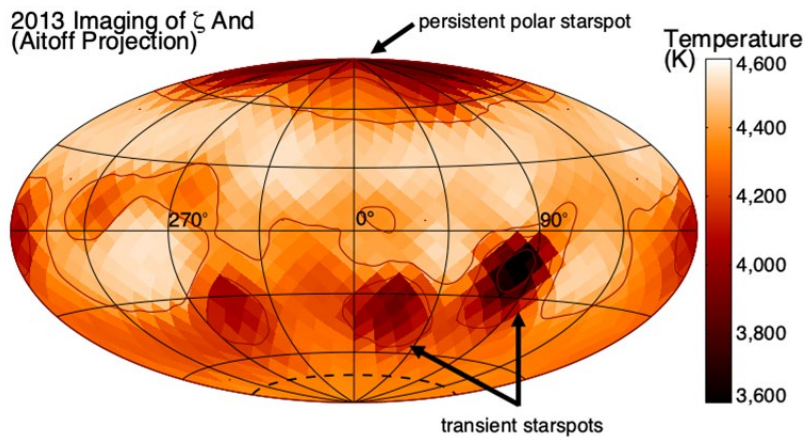


Roettenbacher et al. 2016



ζ And

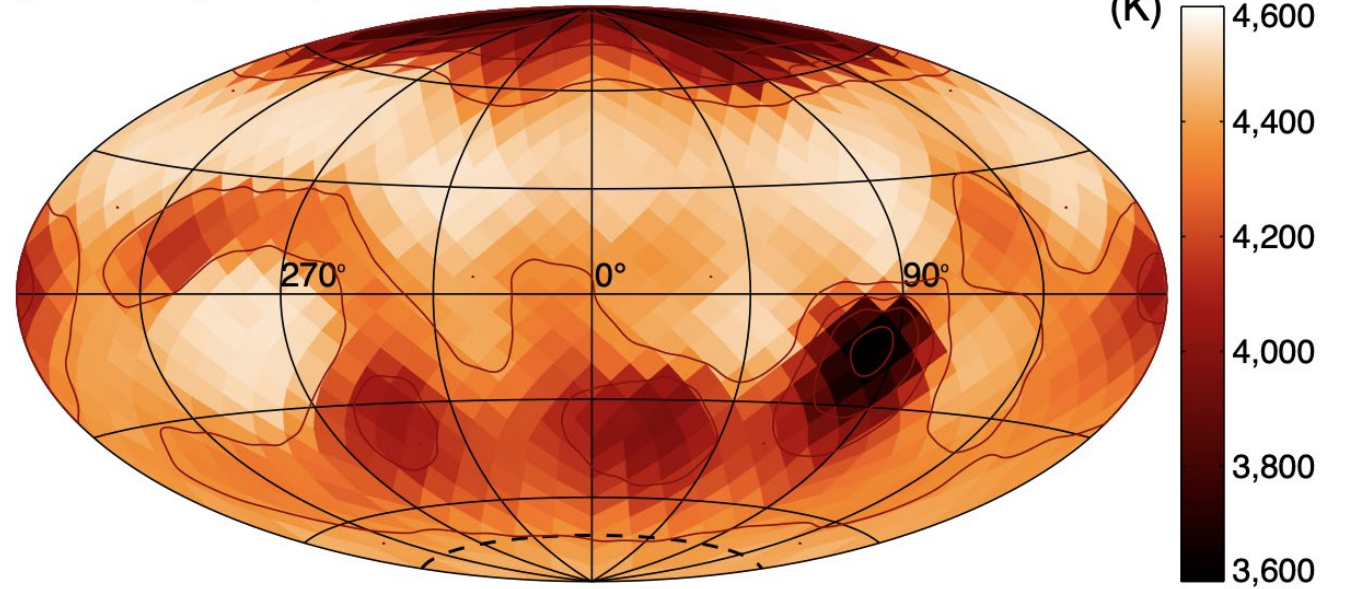
2013 Imaging of ζ And (Aitoff Projection)



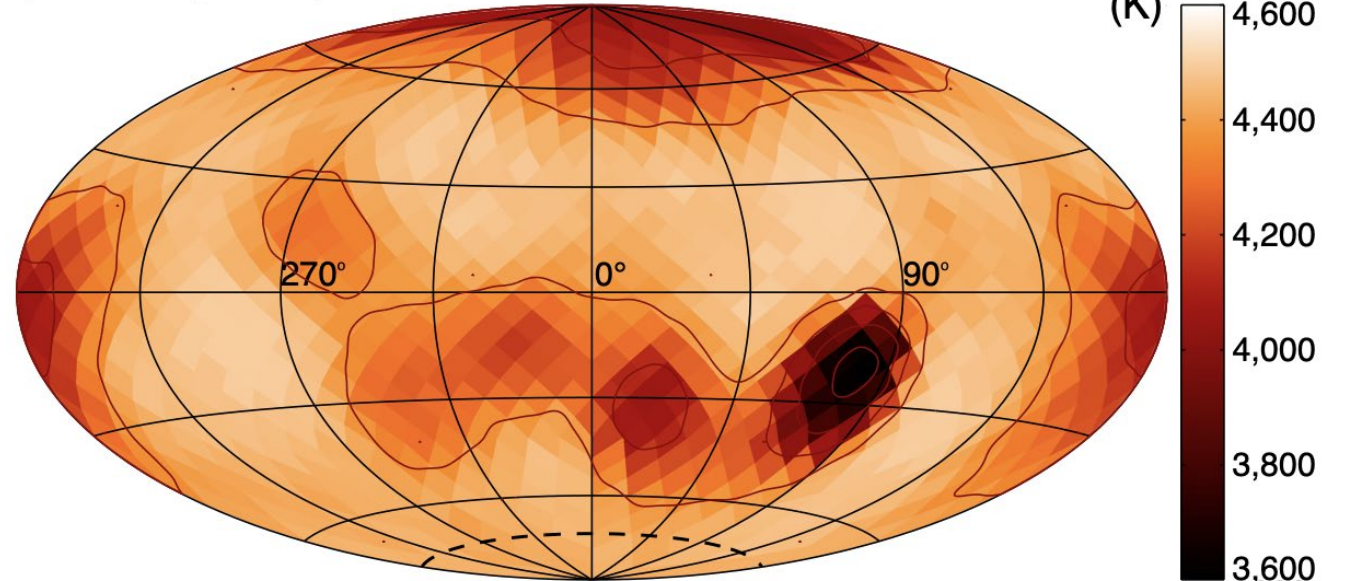
Roettenbacher et al. 2016

2013 Imaging of ζ And (Subset A)
(Aitoff Projection)

ζ And



2013 Imaging of ζ And (Subset B)
(Aitoff Projection)

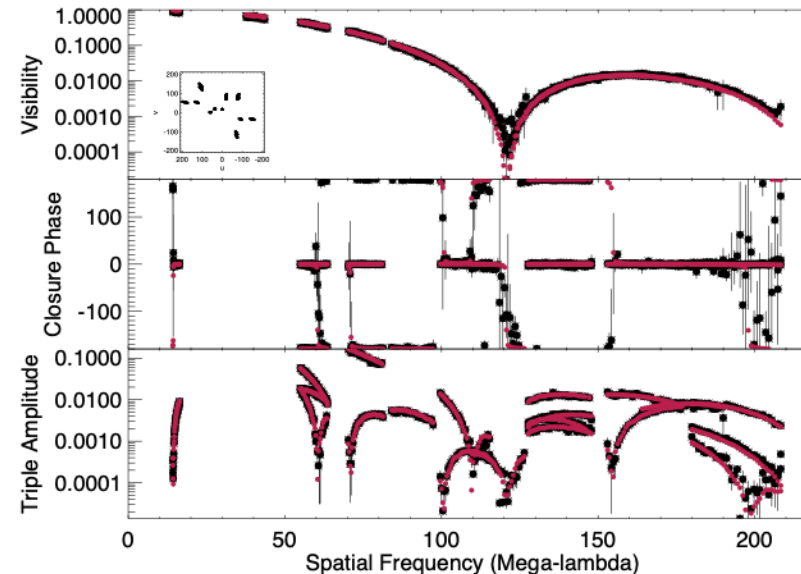
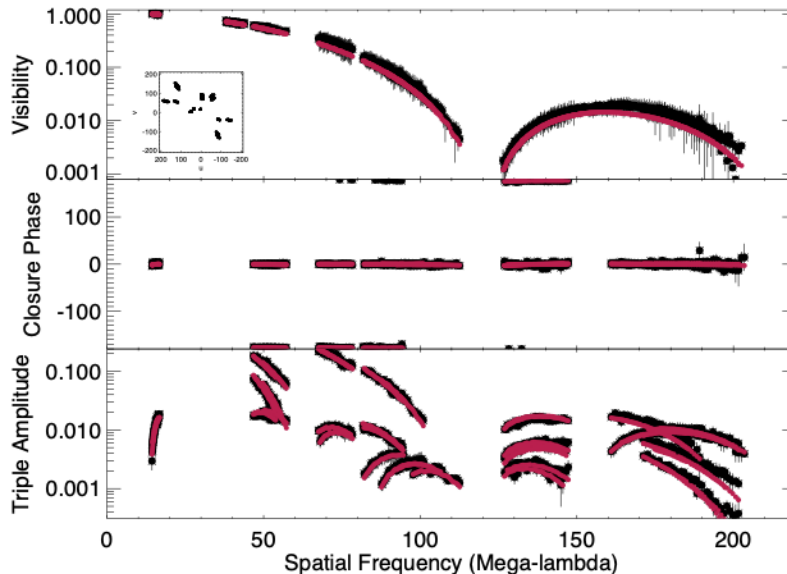


Roettenbacher et al. 2016



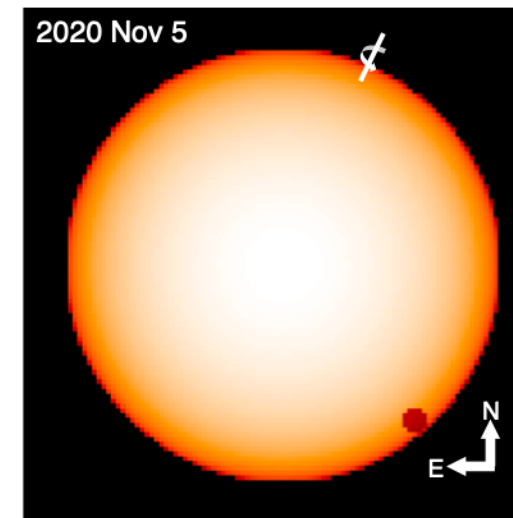
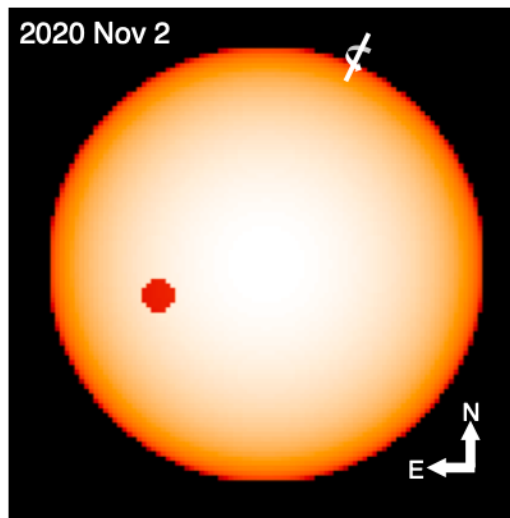
Data Available

ϵ Eri (2020)



Notes:

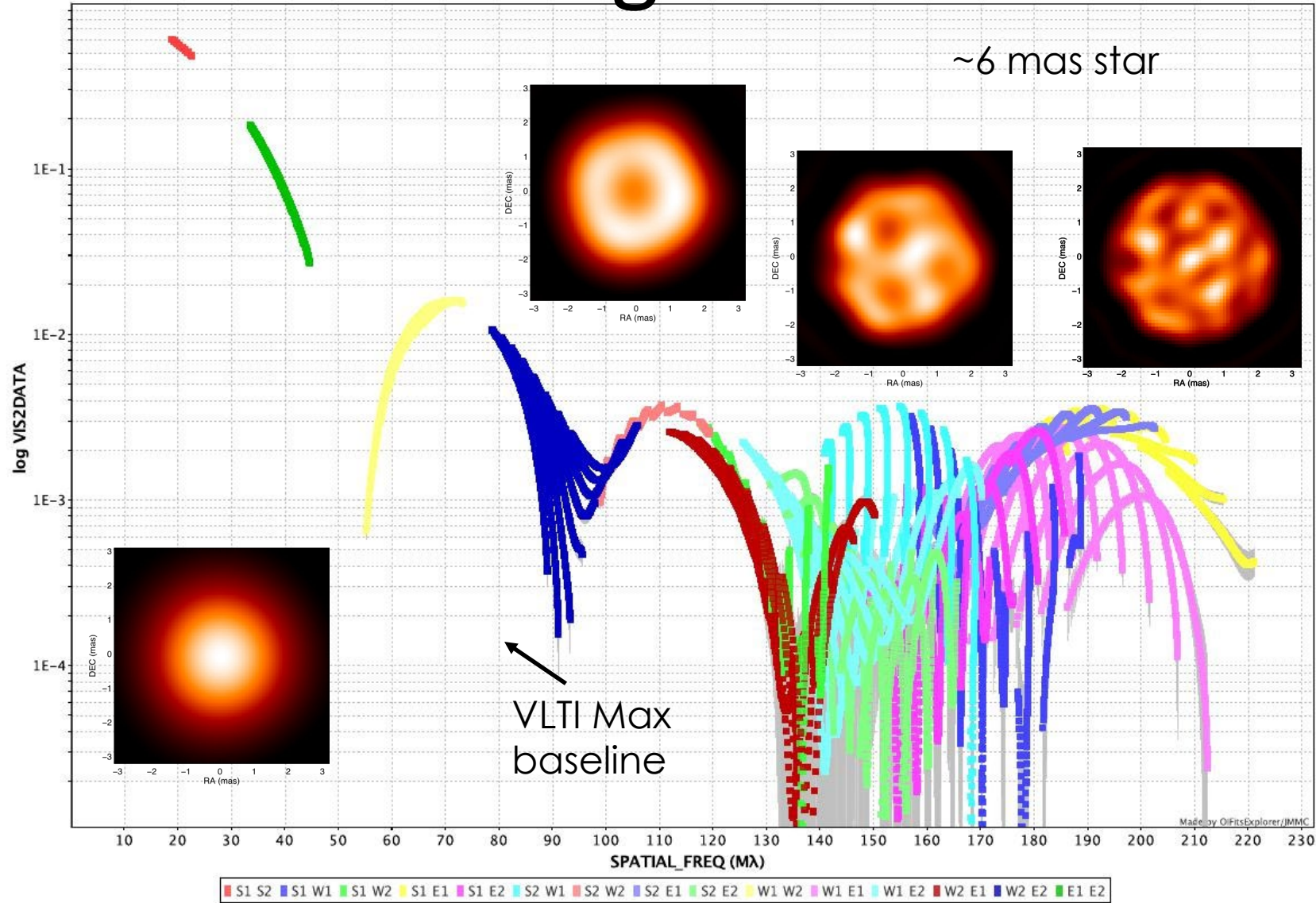
- Assumed diameter from Baines & Armstrong (2011) 2.153 mas
- Used power-law limb-darkening ($\alpha = 0.27$)



Roettenbacher et al. 2022

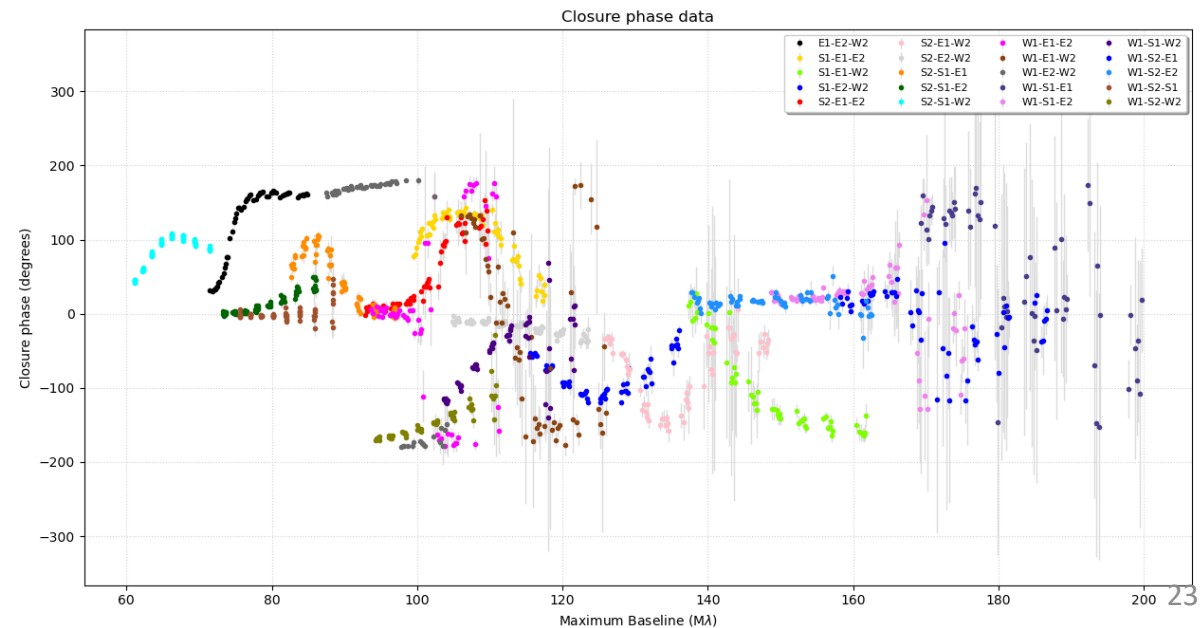
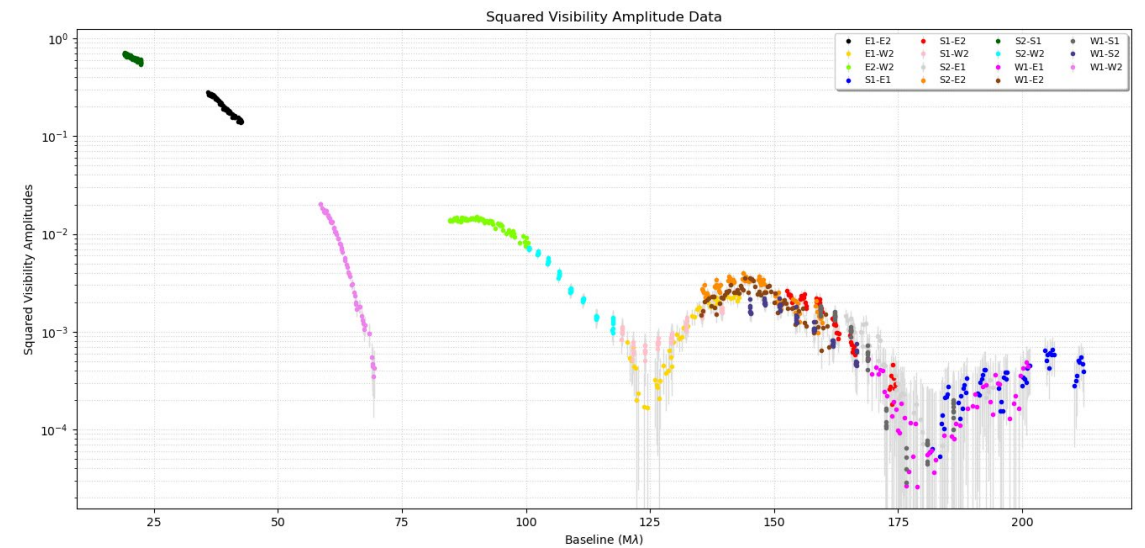
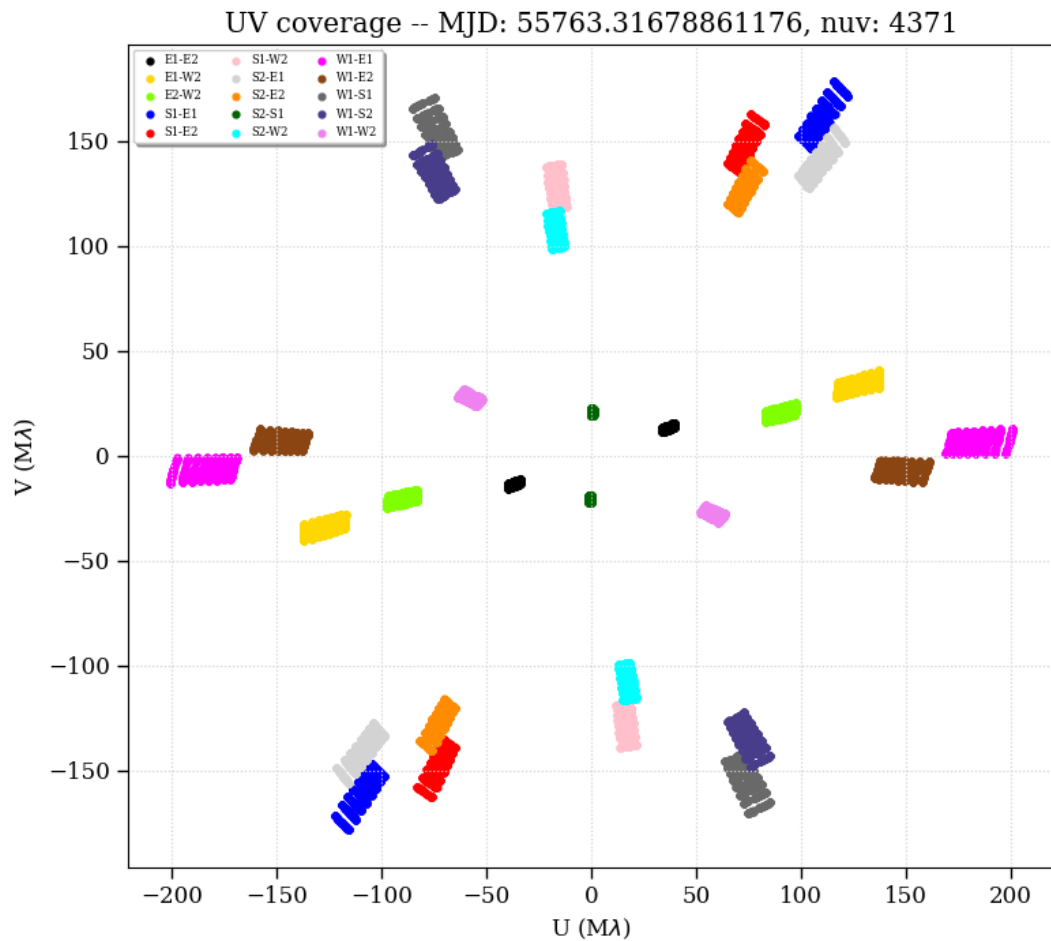


The benefit of long baselines



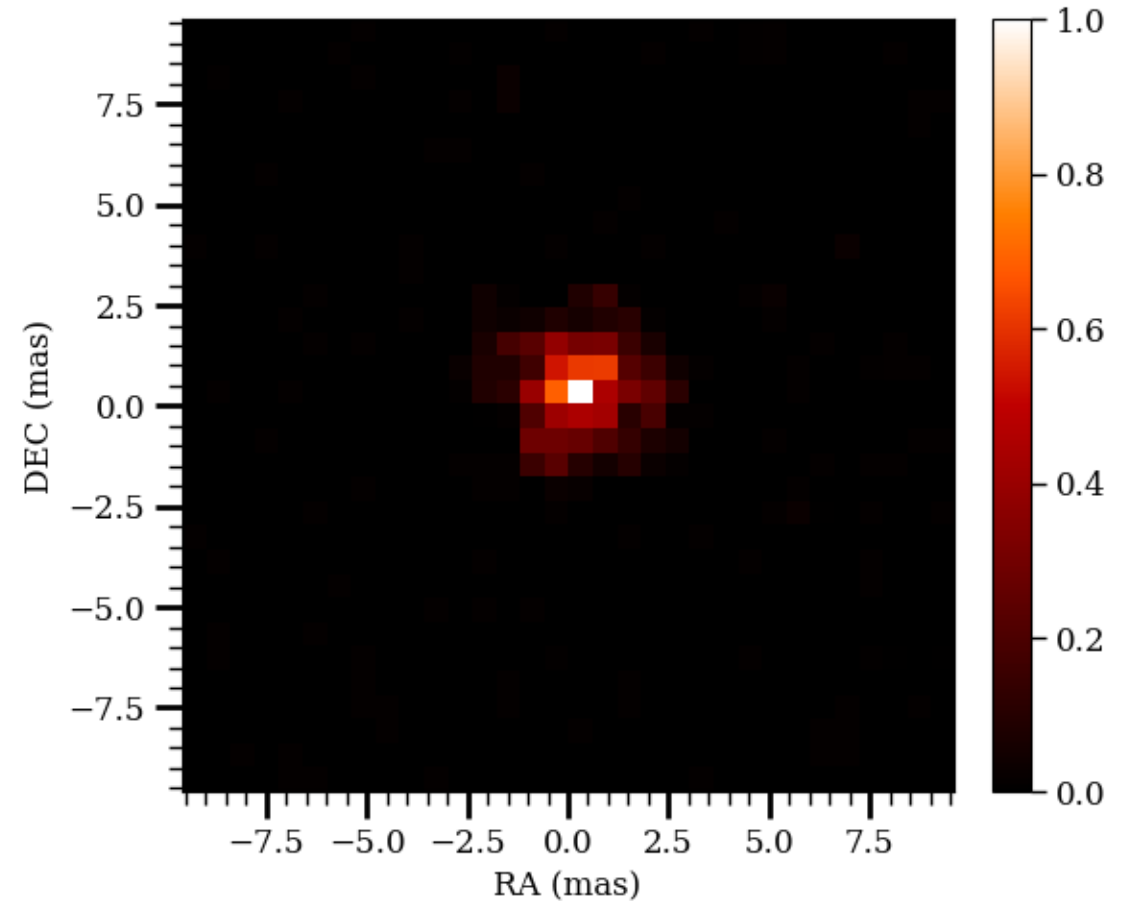


A Journey Through the Process



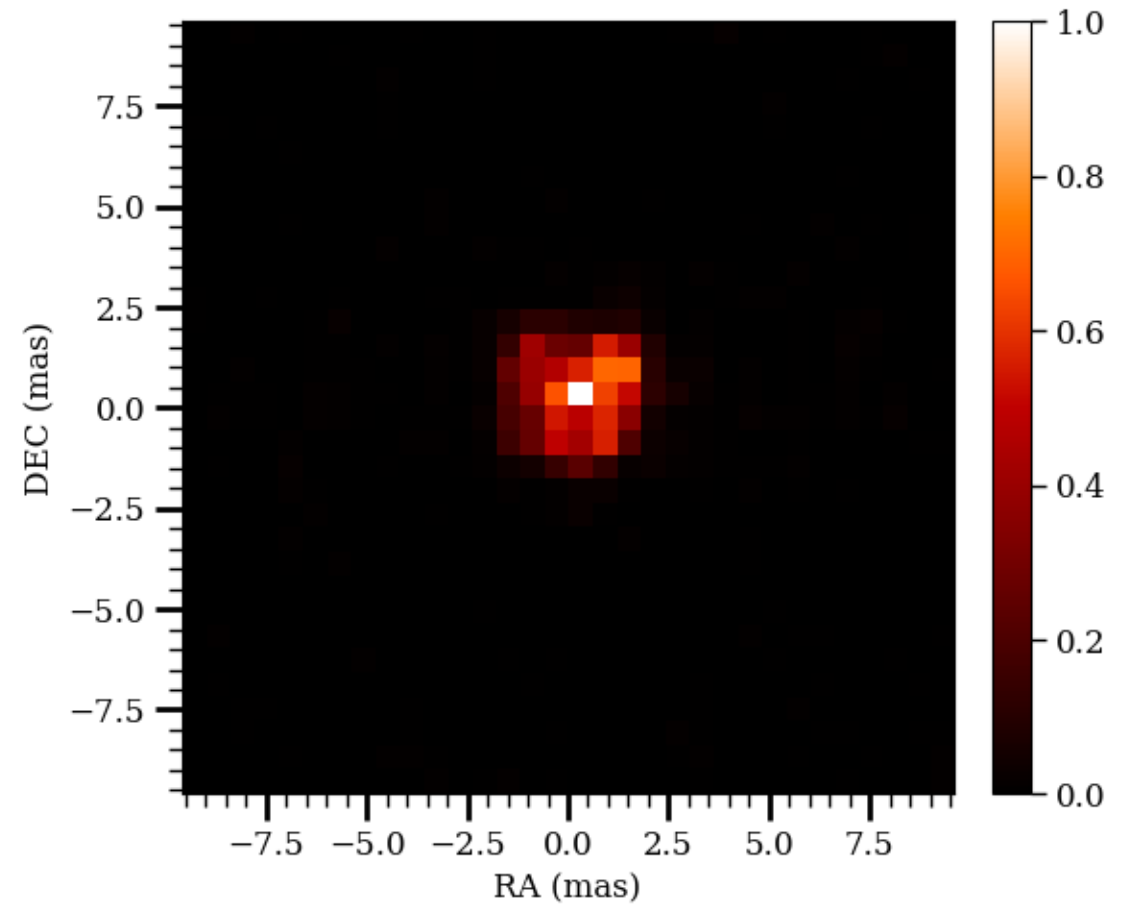
A Journey Through the Process

- Let's start by using SQUEEZE
- And let's try without a regularizer
- Using 32x32 at 0.6 mas/pixel
- 1000 elements



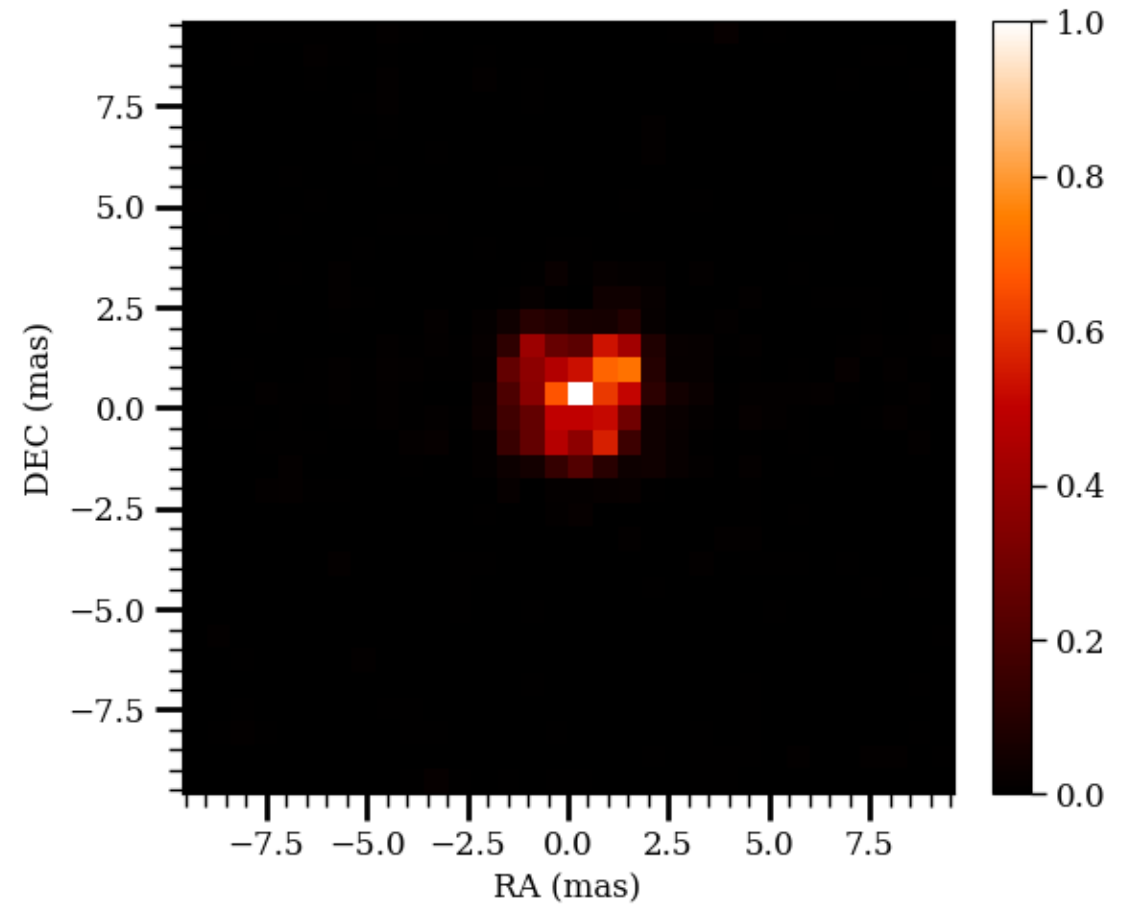
A Journey Through the Process

- Still no regularizers
- Using 32x32 at 0.6 mas/pixel
- 6000 elements



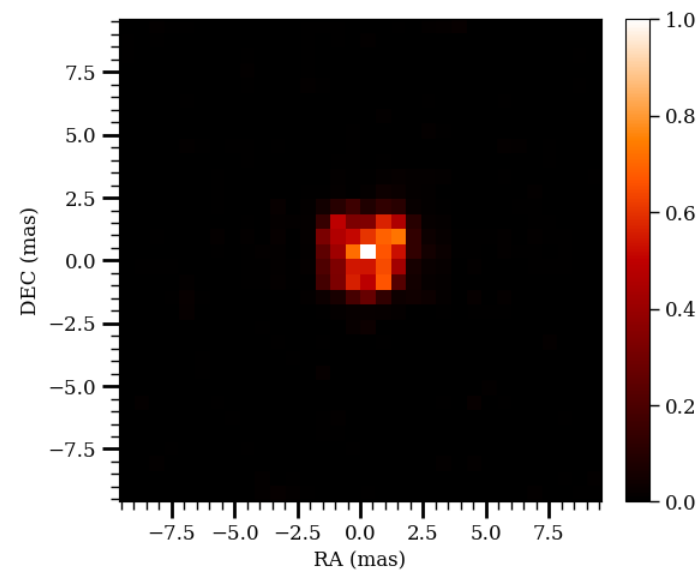
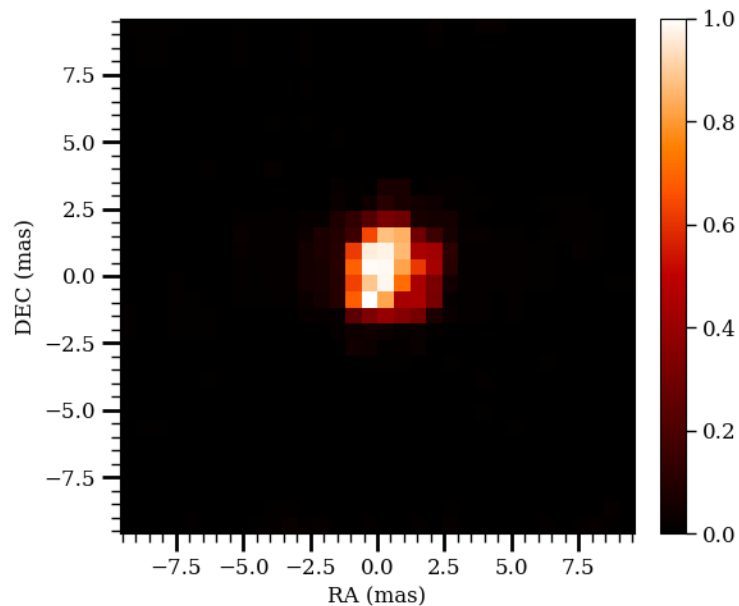
A Journey Through the Process

- Let's try Total Variation
- Hyperparameter 50



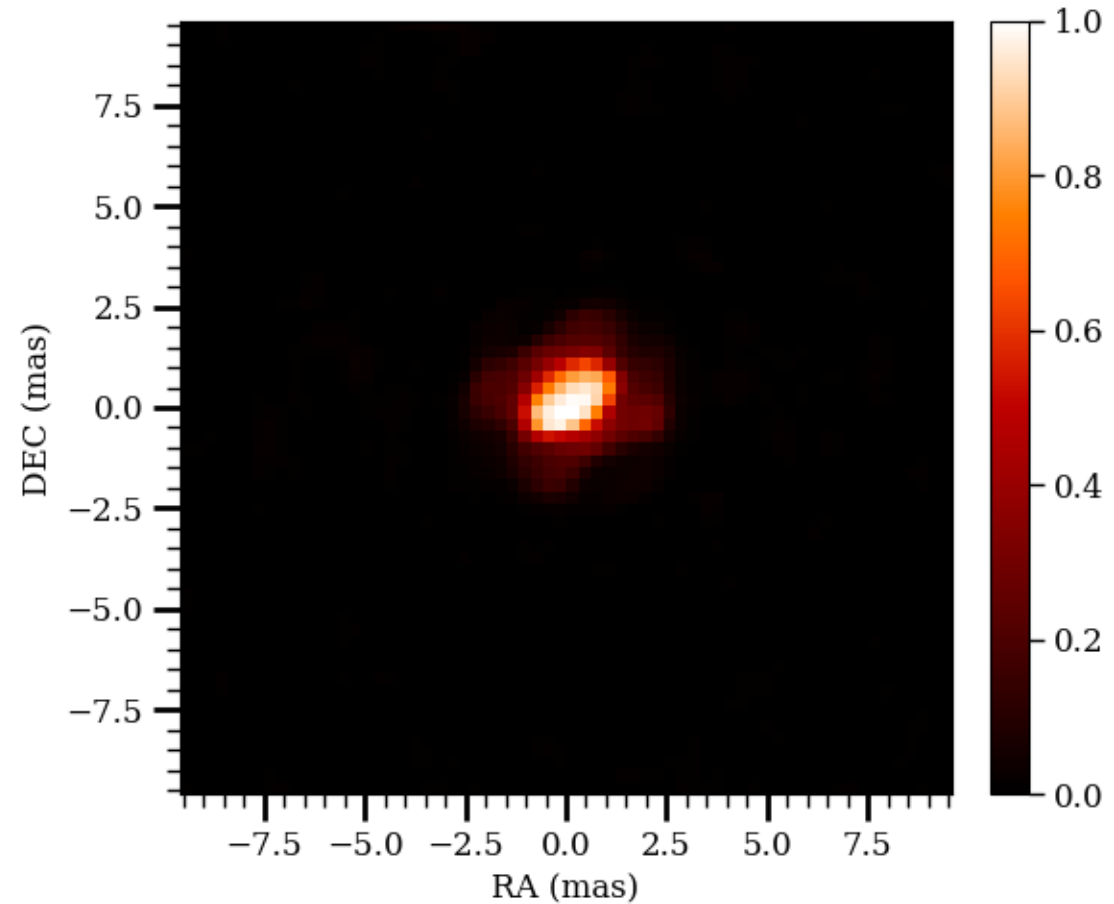
A Journey Through the Process

- Let's try Total Variation
 - Hyperparameter 15000
- Let's try the “uniform disk” regularizer
 - Hyperparameter 5



A Journey Through the Process

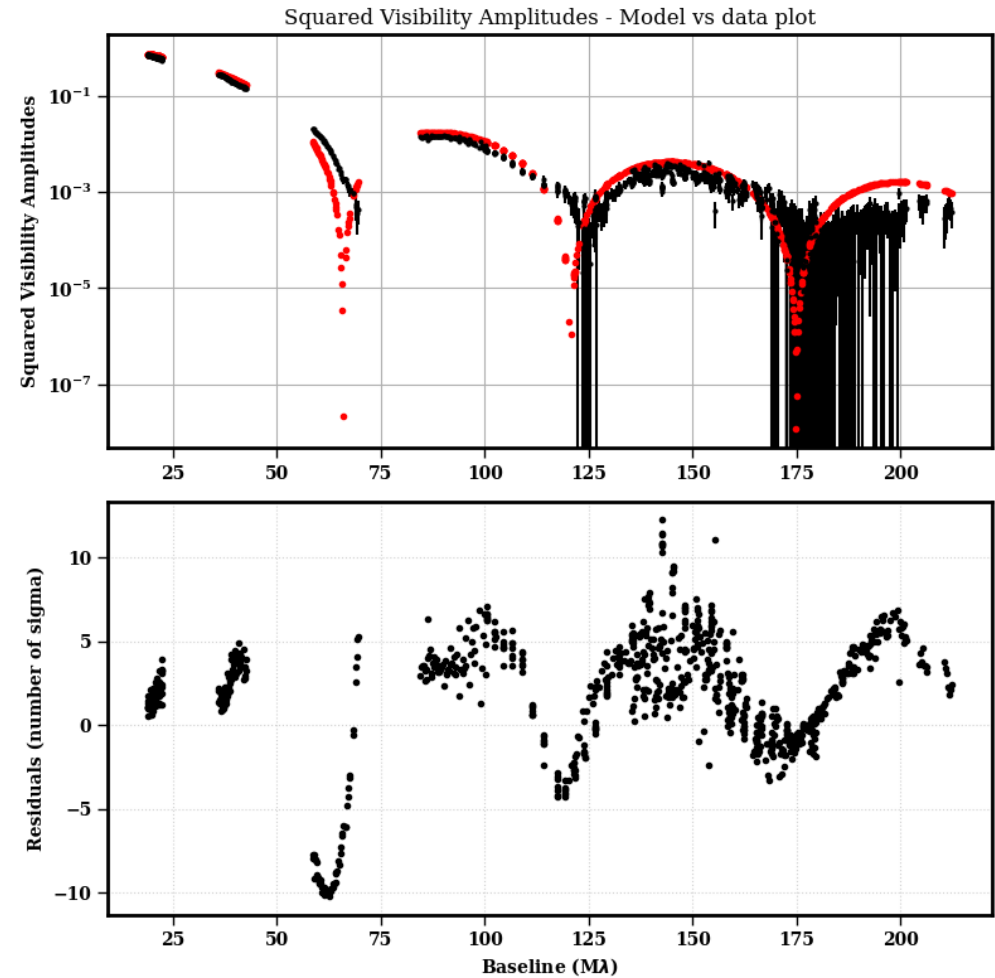
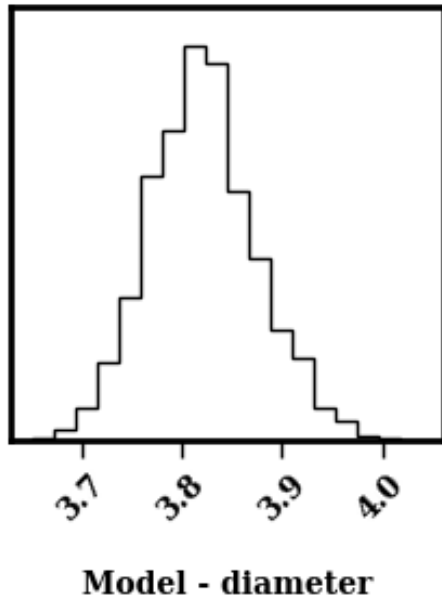
- Let's try in increasing resolution to 0.3 on 64x64 and 6000 elements
 - Hyperparameter 2500



A Journey Through the Process

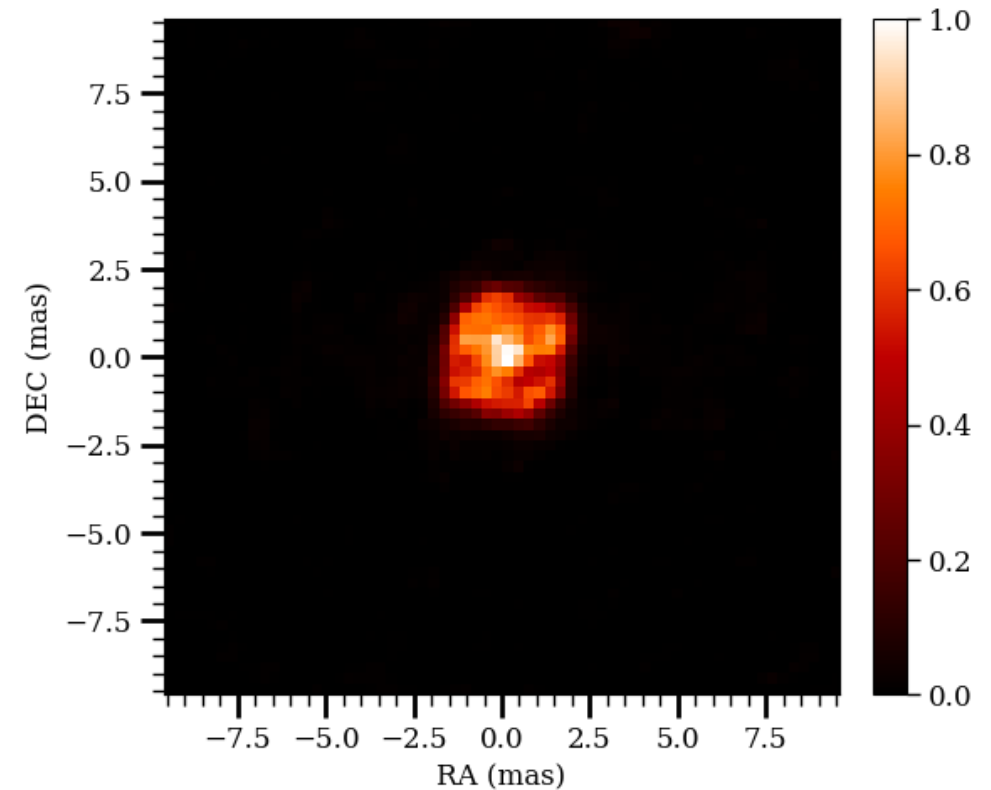
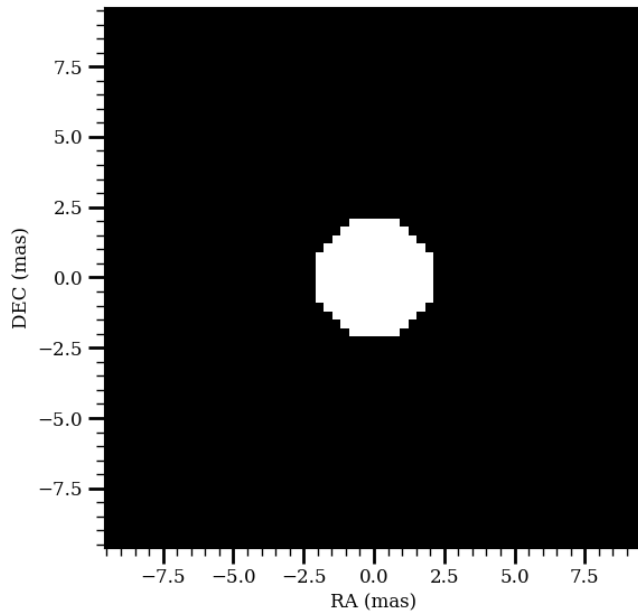
- Okay, let's get a model to start with

Model - diameter = $3.82^{+0.06}_{-0.05}$



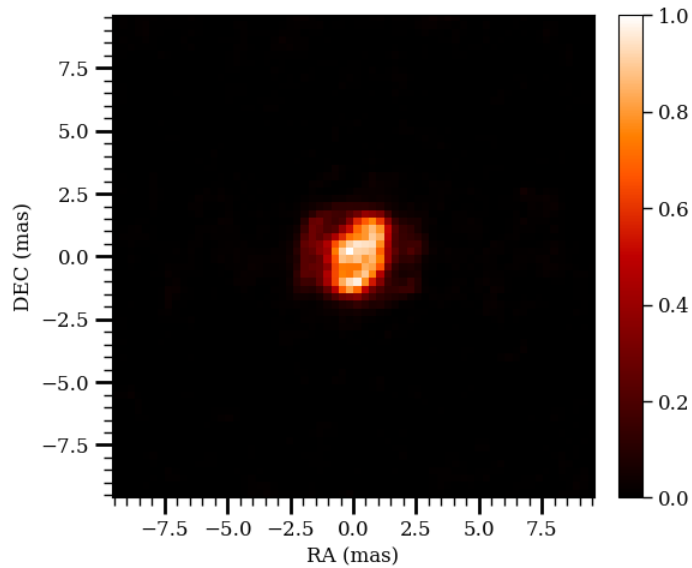
A Journey Through the Process

- 4.25 mas uniform disk
 - Starting image but not constrained to area

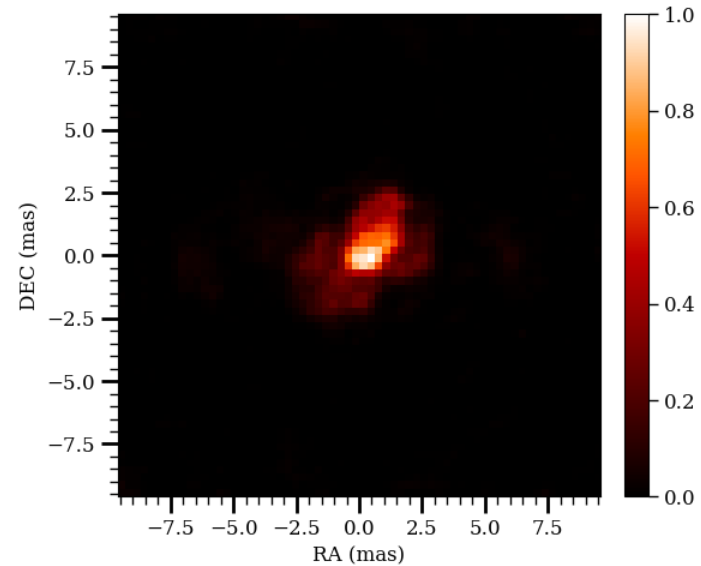


A Journey Through the Process

- Initial image matters
 - 3 mas disk

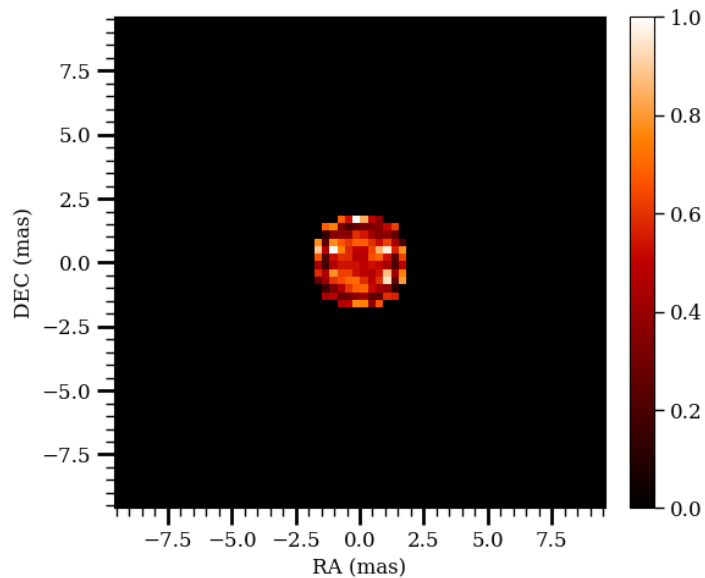


- 6 mas disk



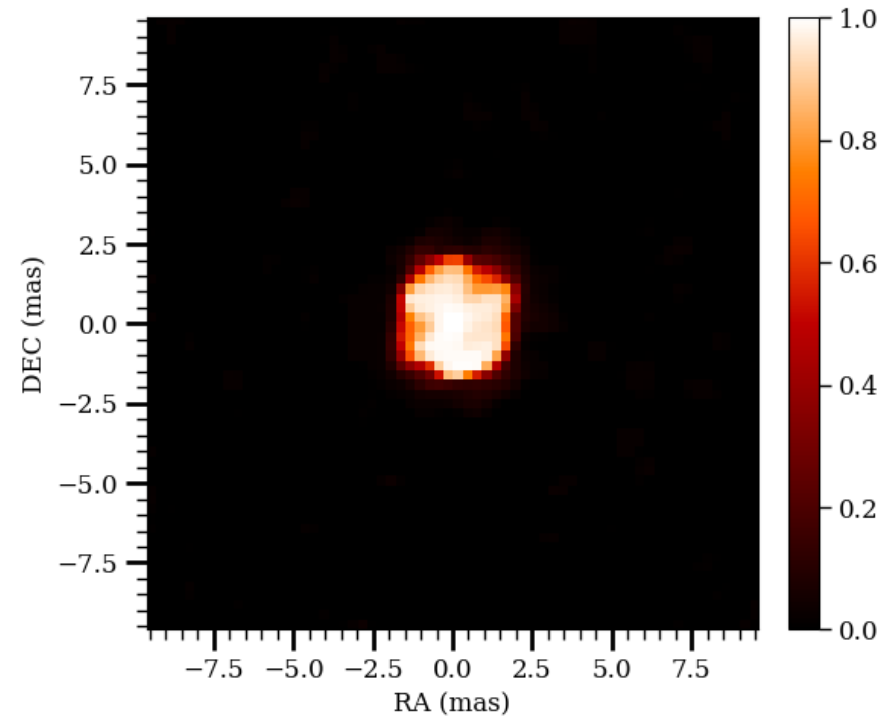
A Journey Through the Process

- Using just prior image (no starting, tries to match input)



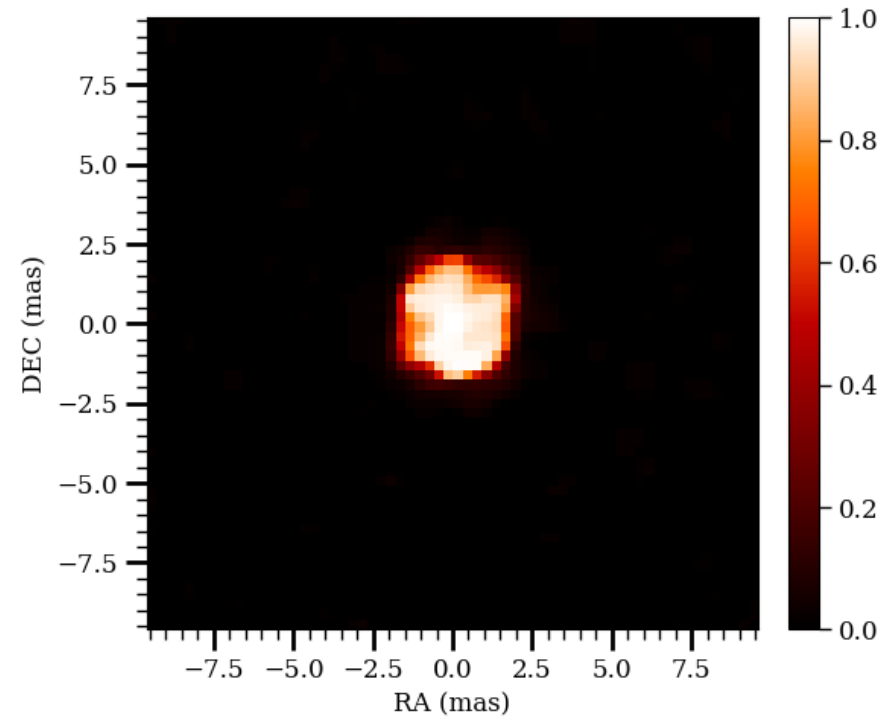
A Journey Through the Process

- Initial image and total variation (over regularized)
- So do we pick?!



A Journey Through the Process

- Initial image and total variation (over regularized)
- So do we pick?!

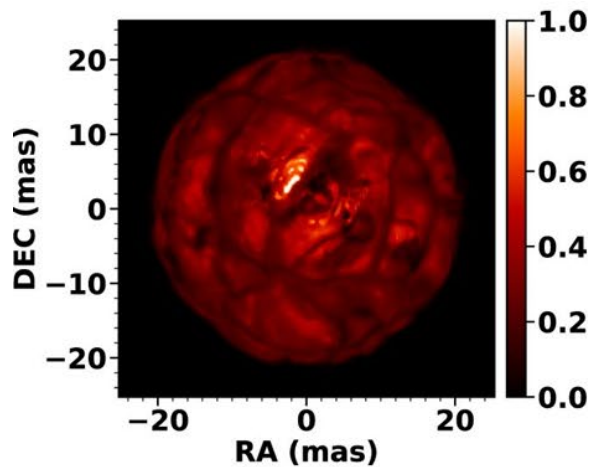


Choosing the Best Regularizer(s)

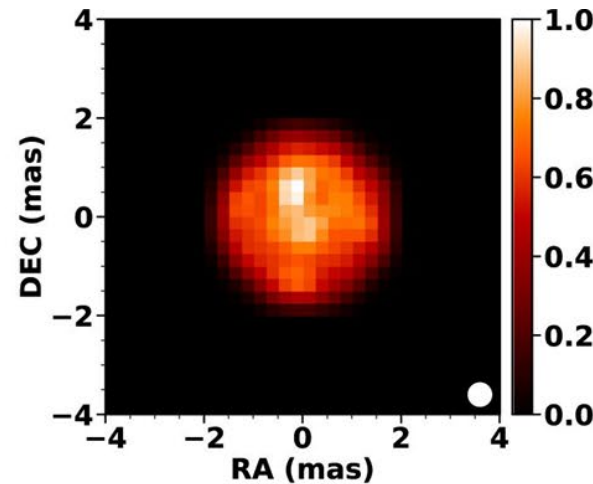
Make a simulated observation using existing data and a source image

(<https://github.com/fabienbaron/OITTOOLS.jl>)

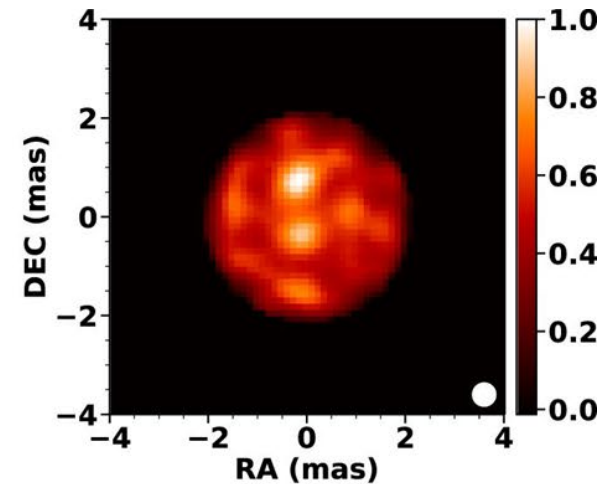
Reconstruct for a variety of combinations of regularizers and hyperparameters



Unconvolved Source Image



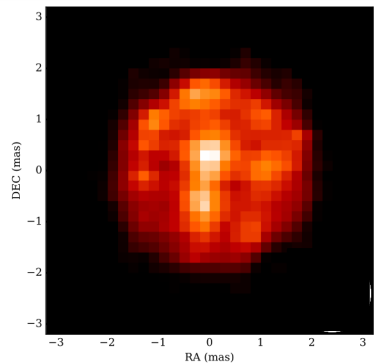
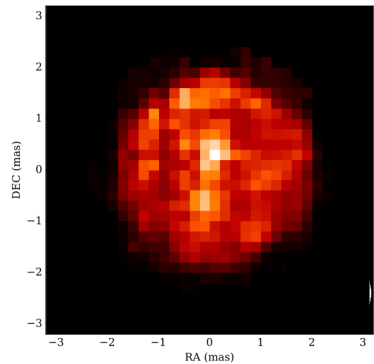
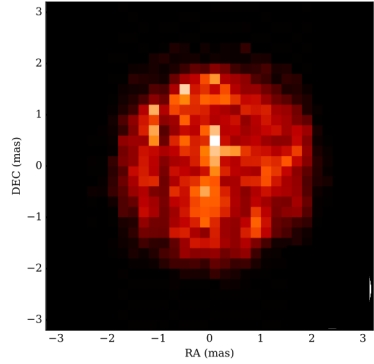
Scaled down, convolved Source Image



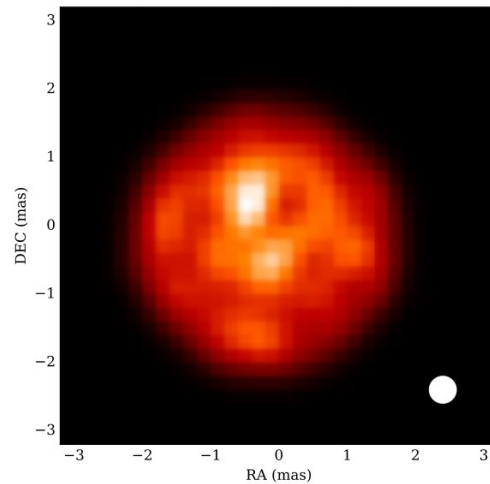
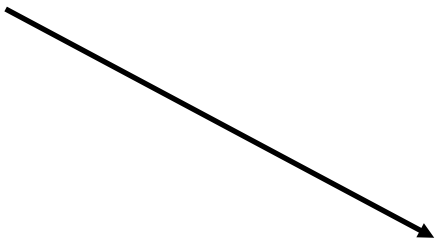
Best fitting reconstruction



Choosing the Best Regularizer(s)



Gomes et al. 2017 found the l_1 -norm to be the best metric for assessing quality

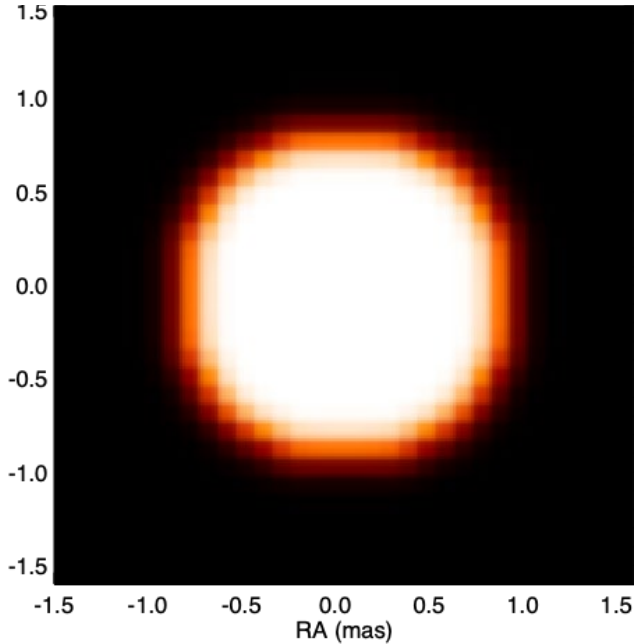


Compare the stack of reconstructions to the source image convolved to reconstruction resolution using some metric and find best fitting reconstruction

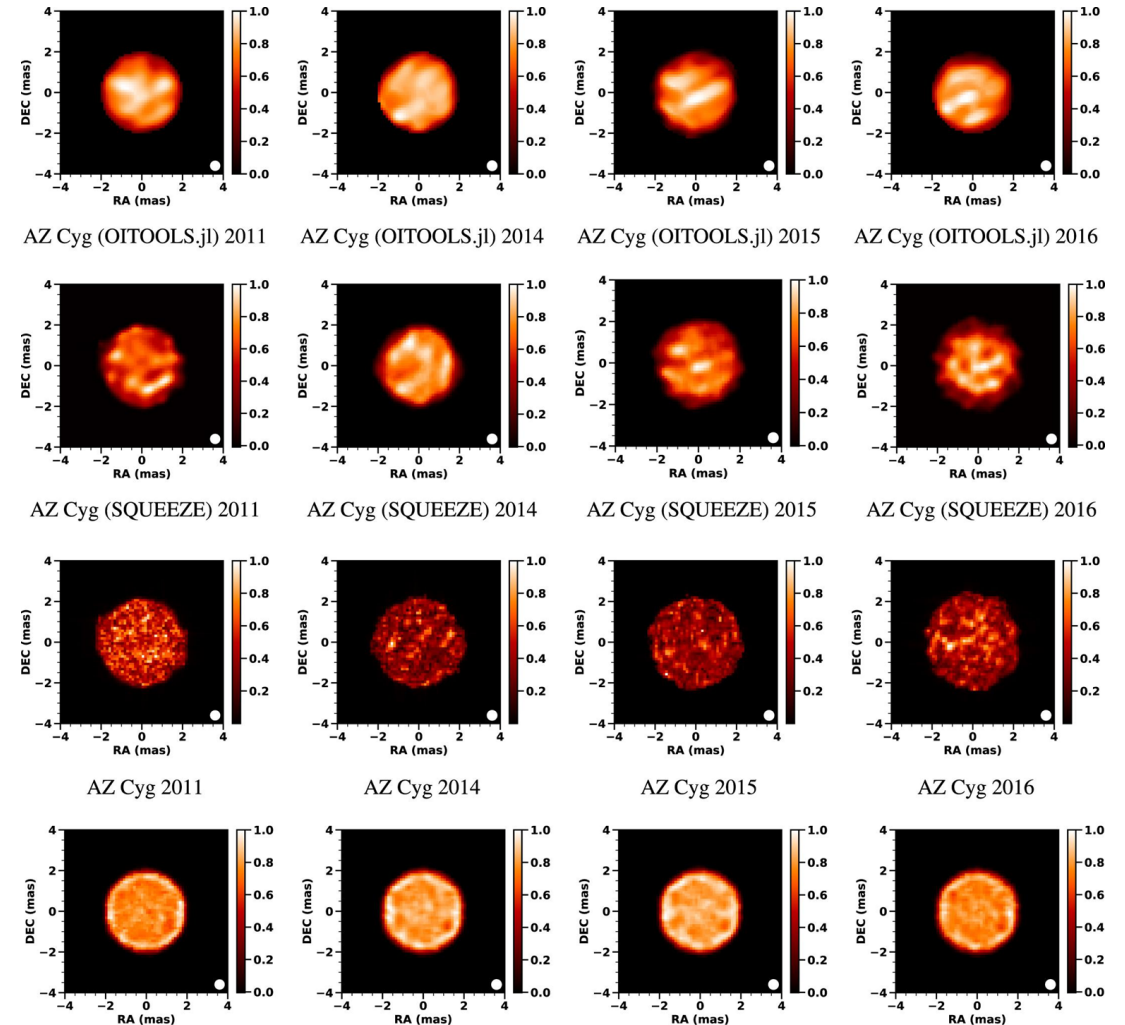


Verifying Features

Make a simulated observation using existing data and a source image of a limb darkened disk



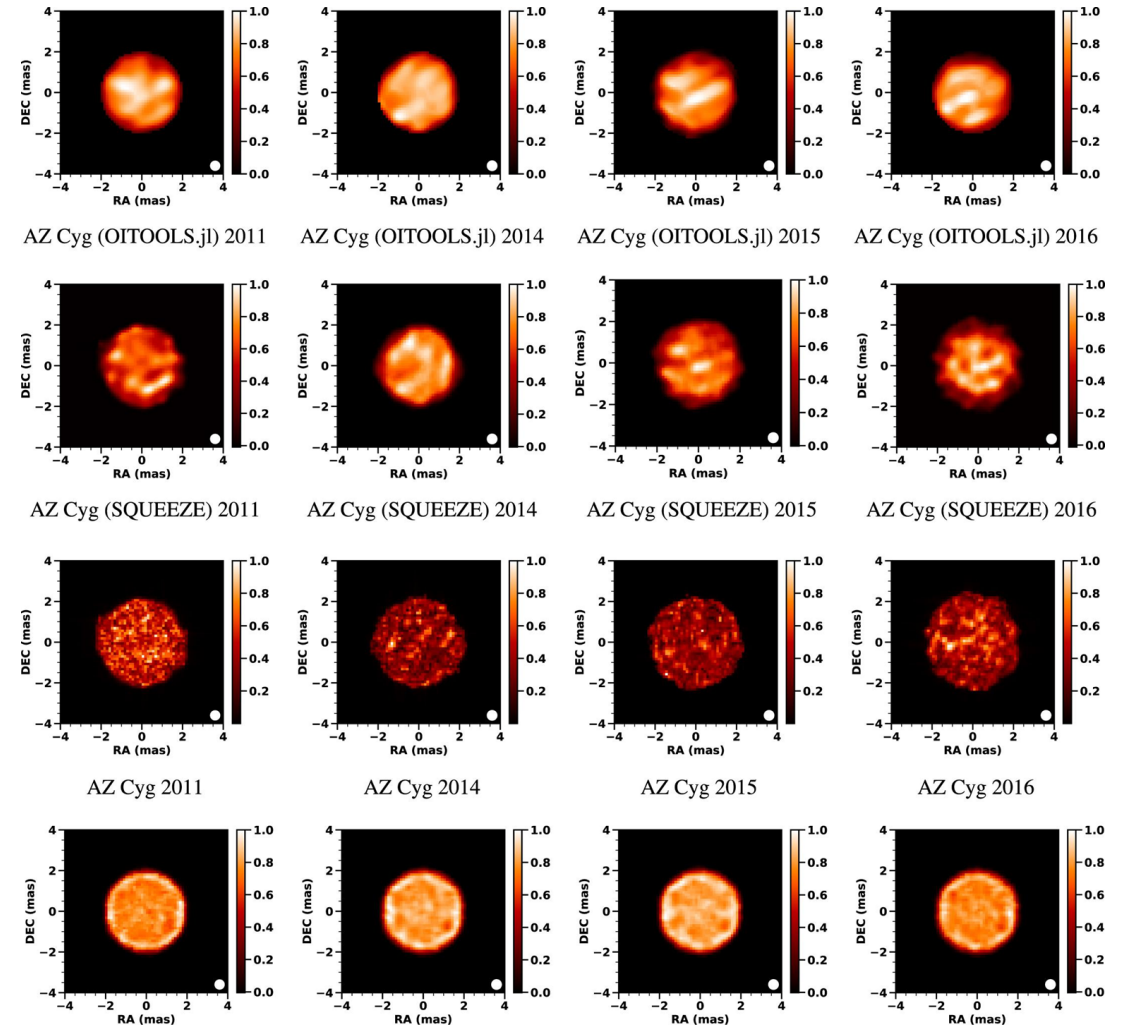
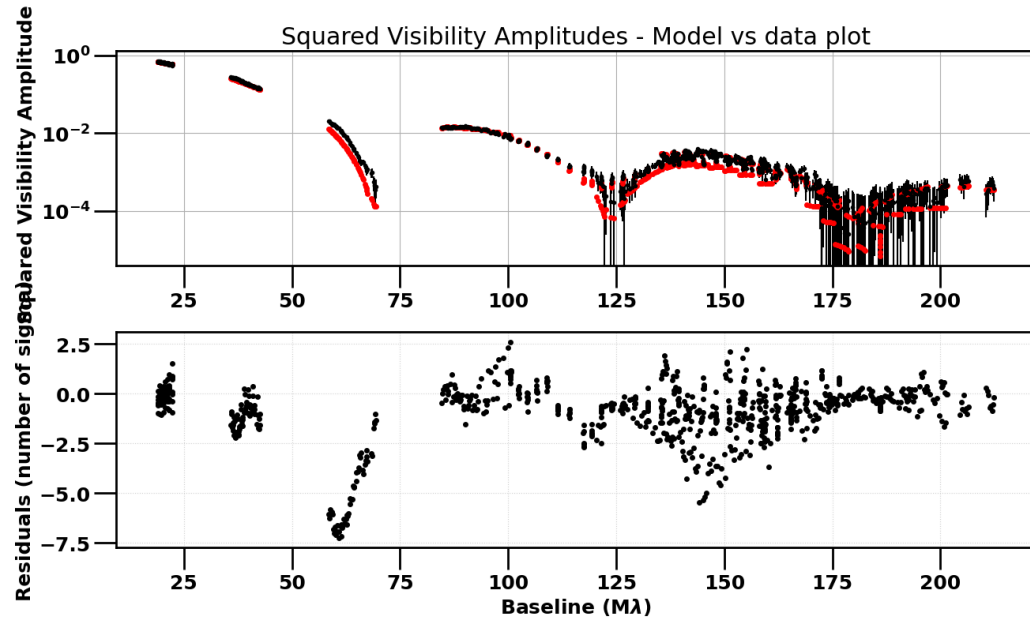
Reconstruct with the same parameters as your image and compare





Verifying Features

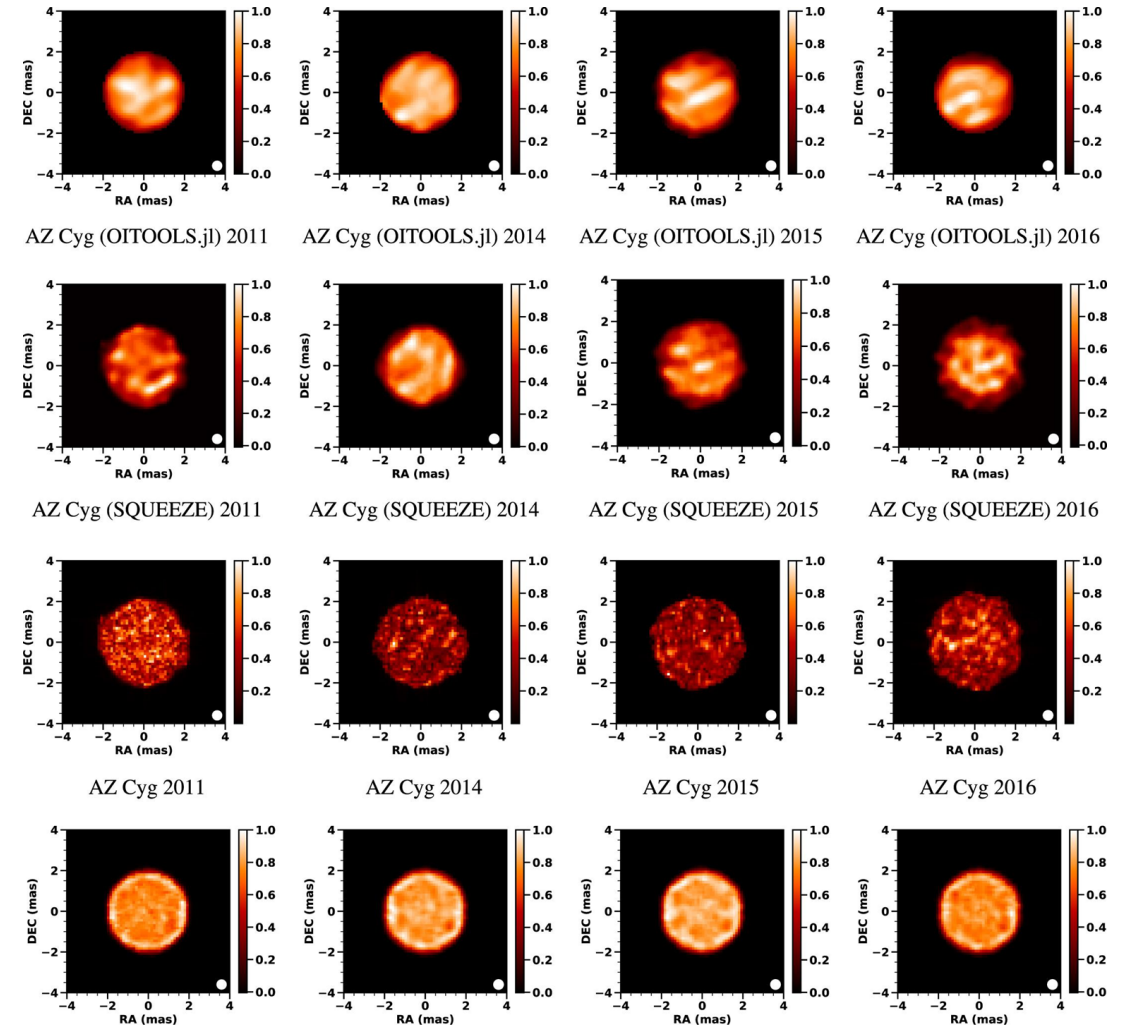
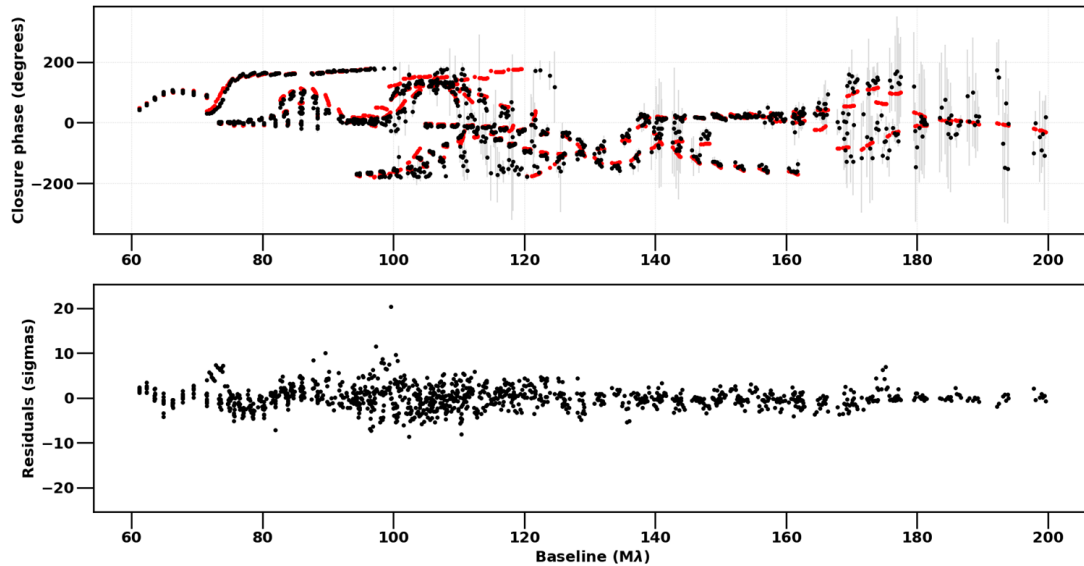
Use more than one type of image reconstruction method and/or tool!





Verifying Features

Use more than one type of image reconstruction method and/or tool!





64x64 0.3 mas/pix 128x128 0.15 mas/pix

