

Florida Institute of Technology

High-contrast Imaging of Massive Stars

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Melbourne, Florida



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KU LEUVEN

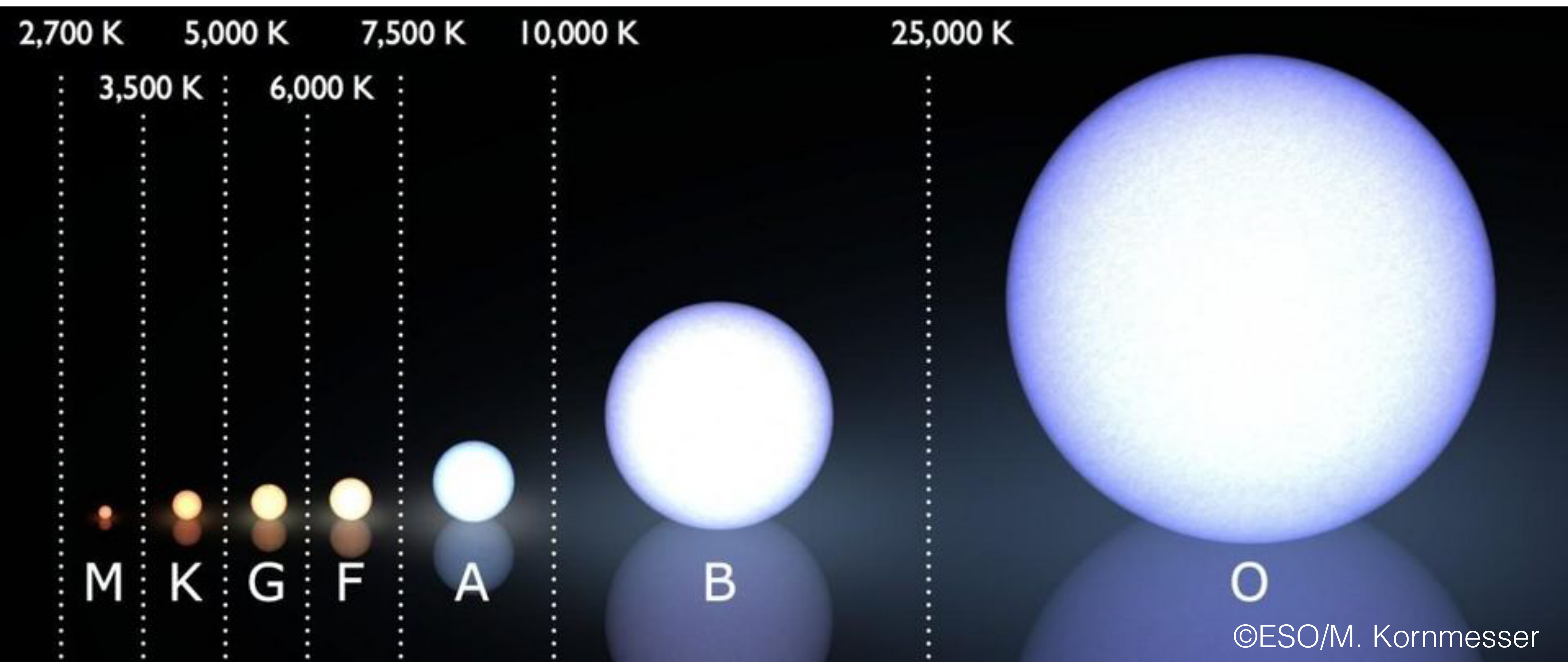
Outline

1. Scientific overview
2. High-contrast imaging: VIP, SHIPS, ...
3. The CHIPS project
4. Published results: QZ Car, Tr14
5. Future of HCi

Scientific context



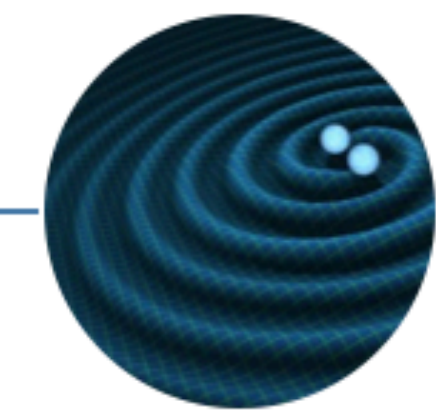
M101, ©STScI/NASA



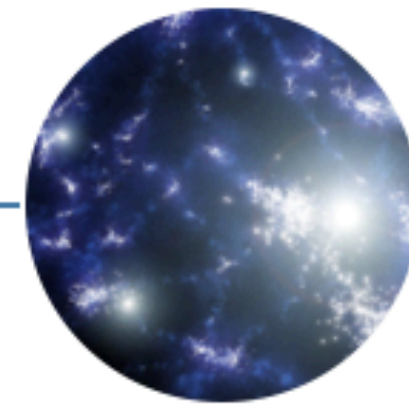
$M > 8M_{\odot}$



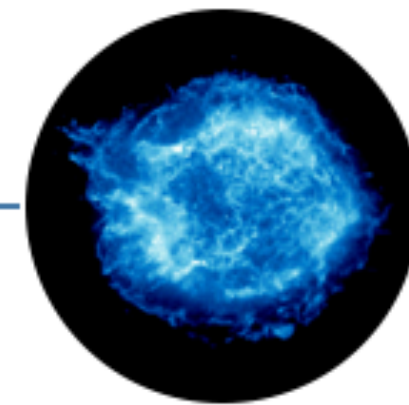
Massive stars



Gravitational wave sources



First Stars & Galaxy formation and evolution



Supernova (progenitors)

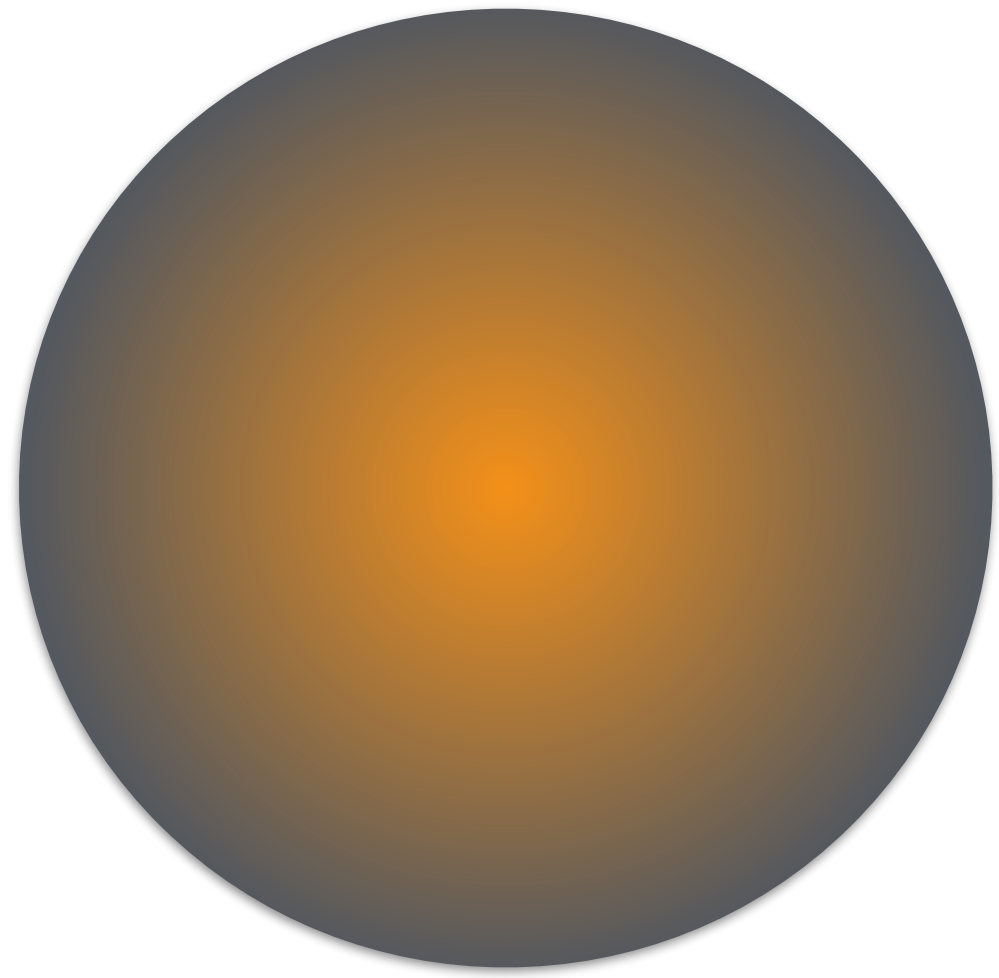


Nucleosynthesis & Feedback

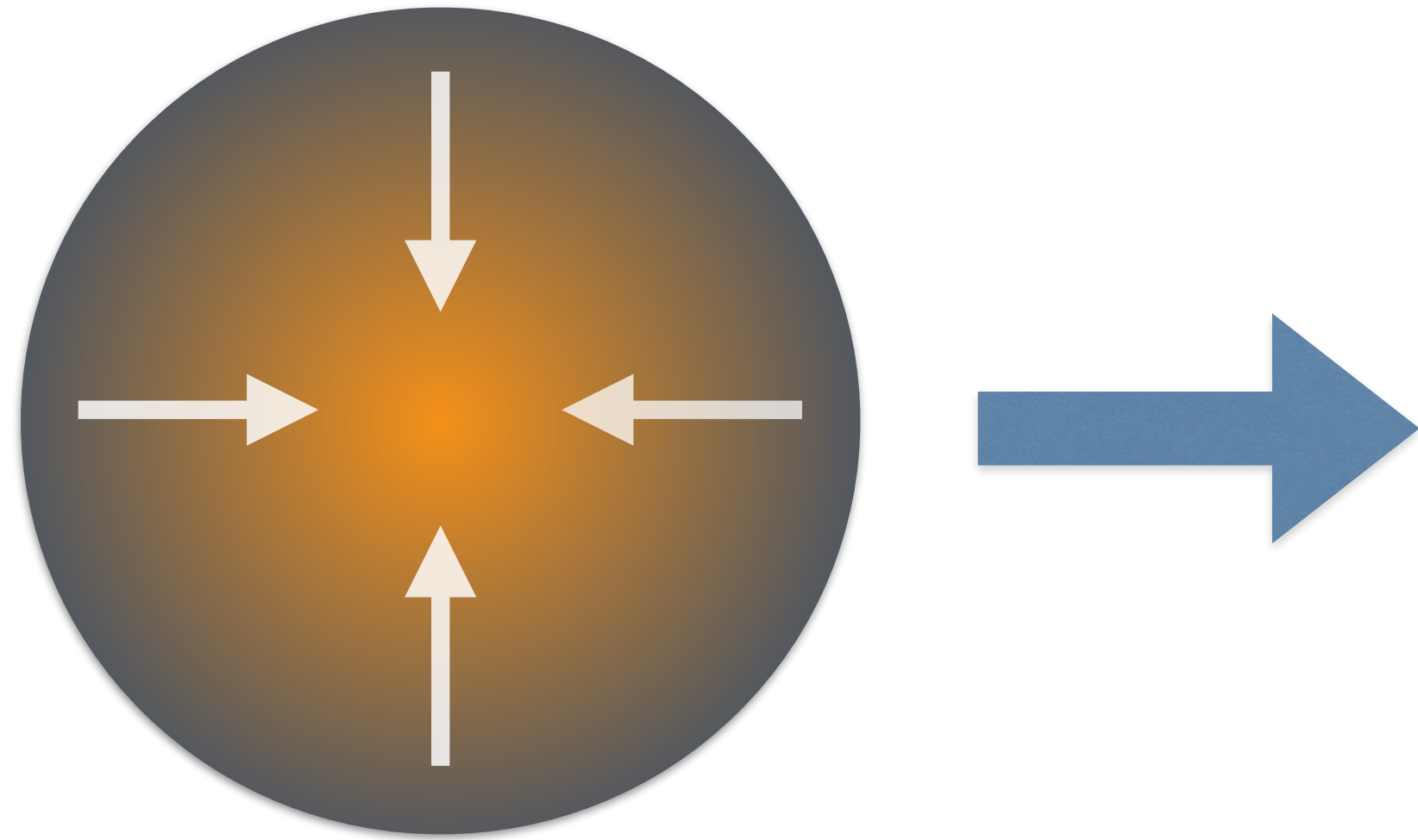
$> 80\%$ binaries

$\tau_{\text{form}} \sim 10^5$ years

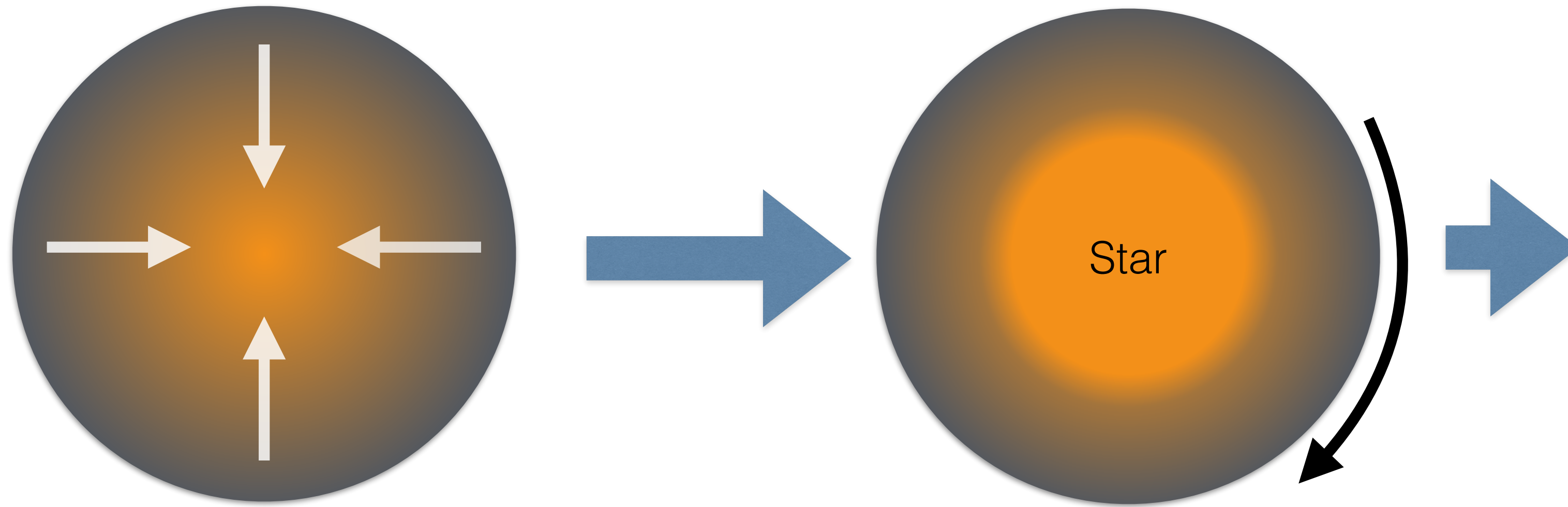
Massive Star Formation



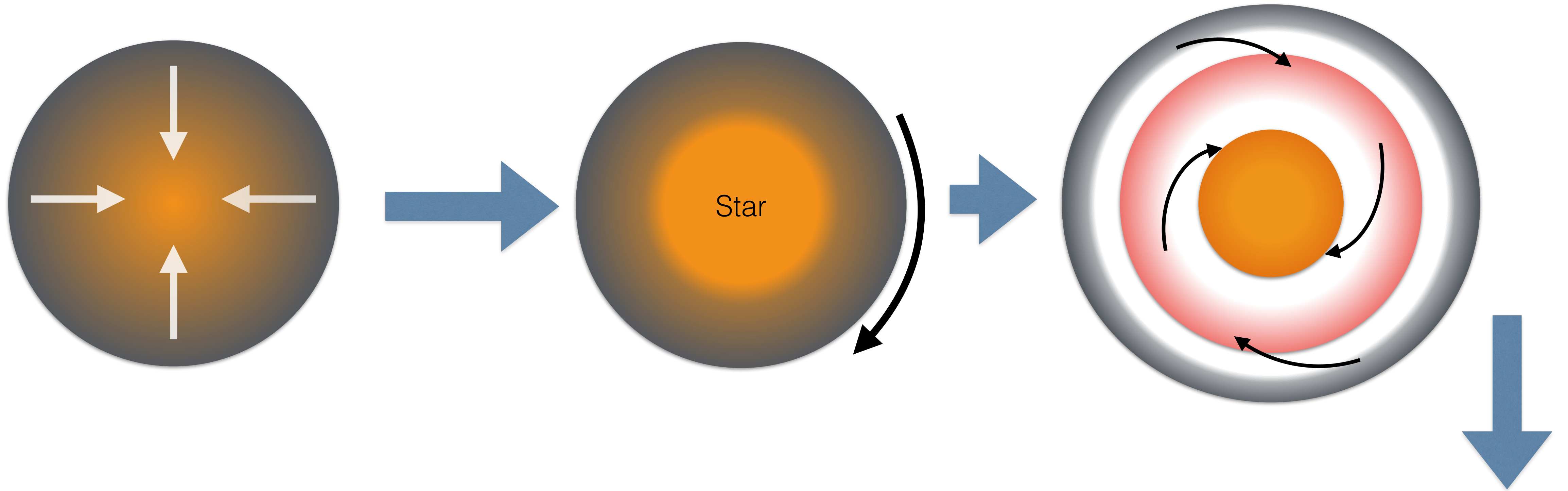
Massive Star Formation



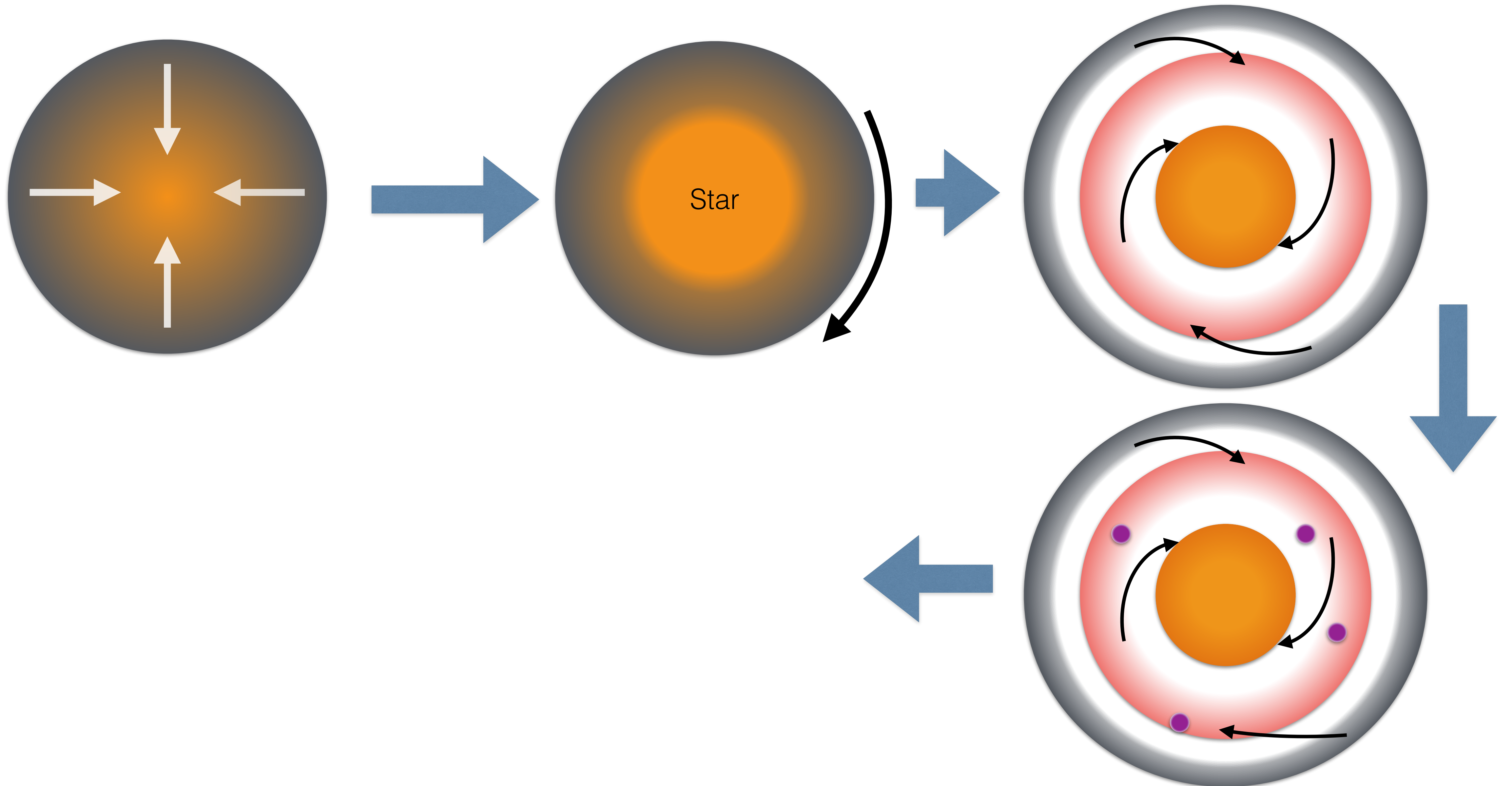
Massive Star Formation



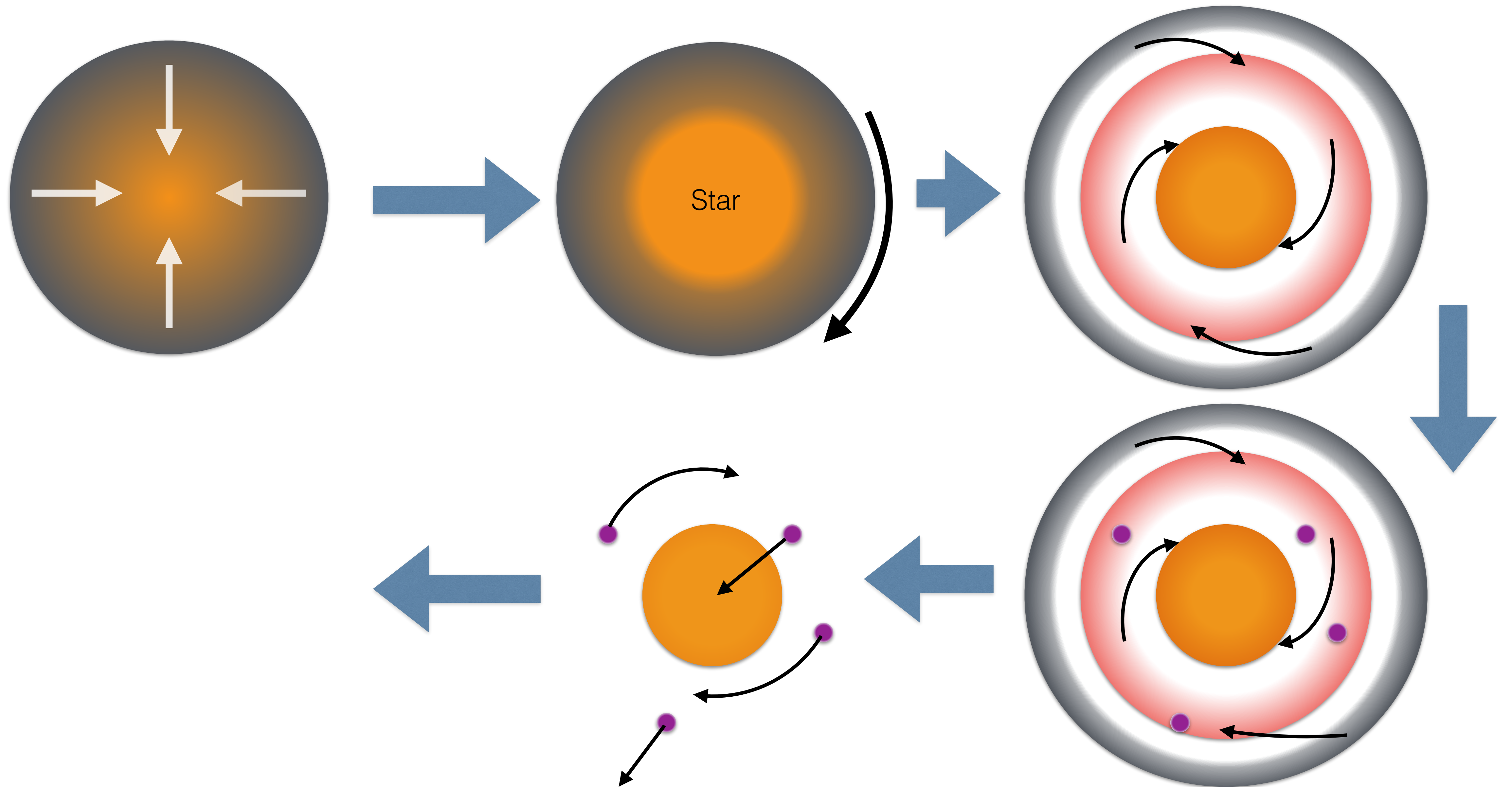
Massive Star Formation



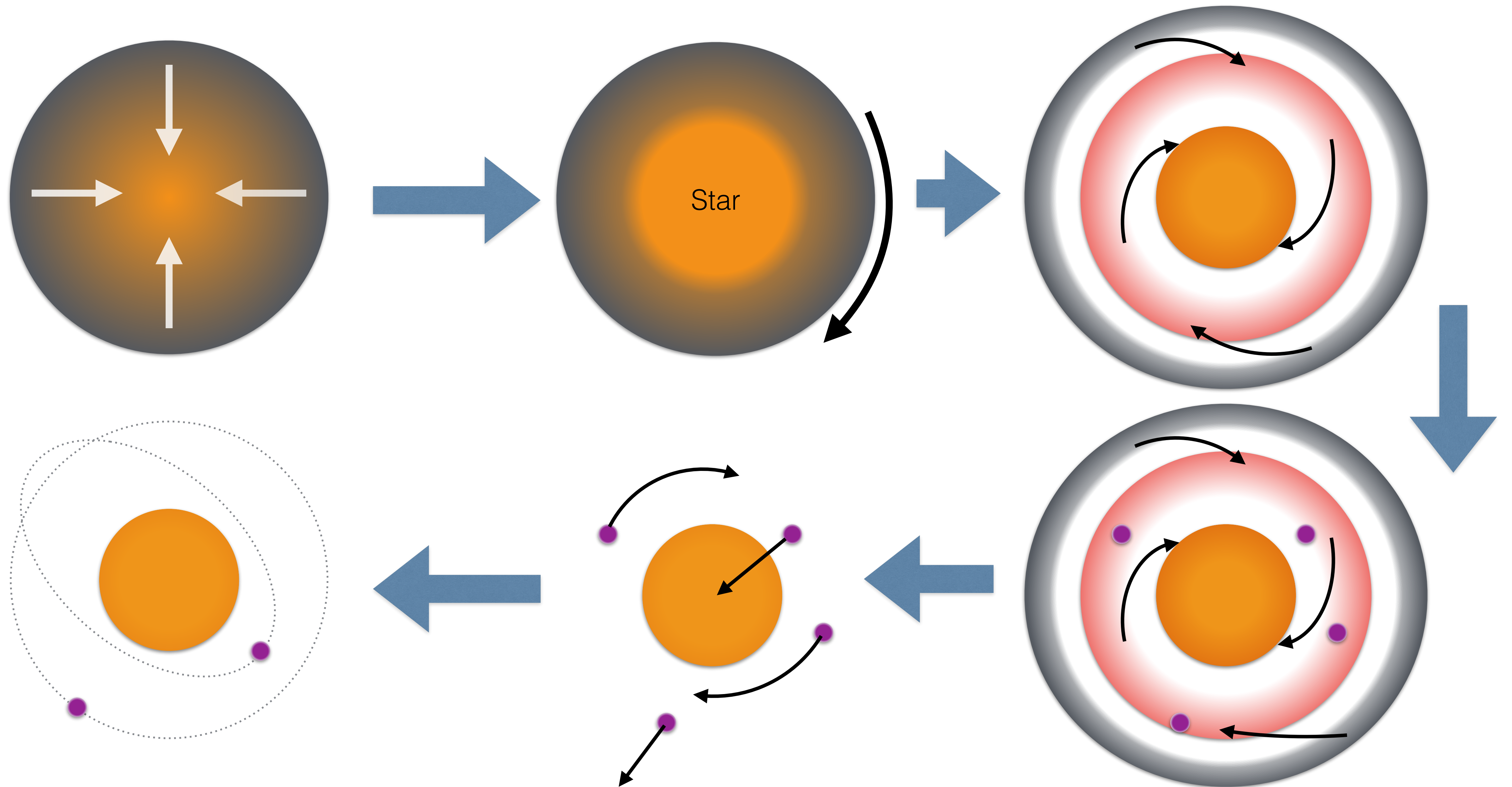
Massive Star Formation



Massive Star Formation

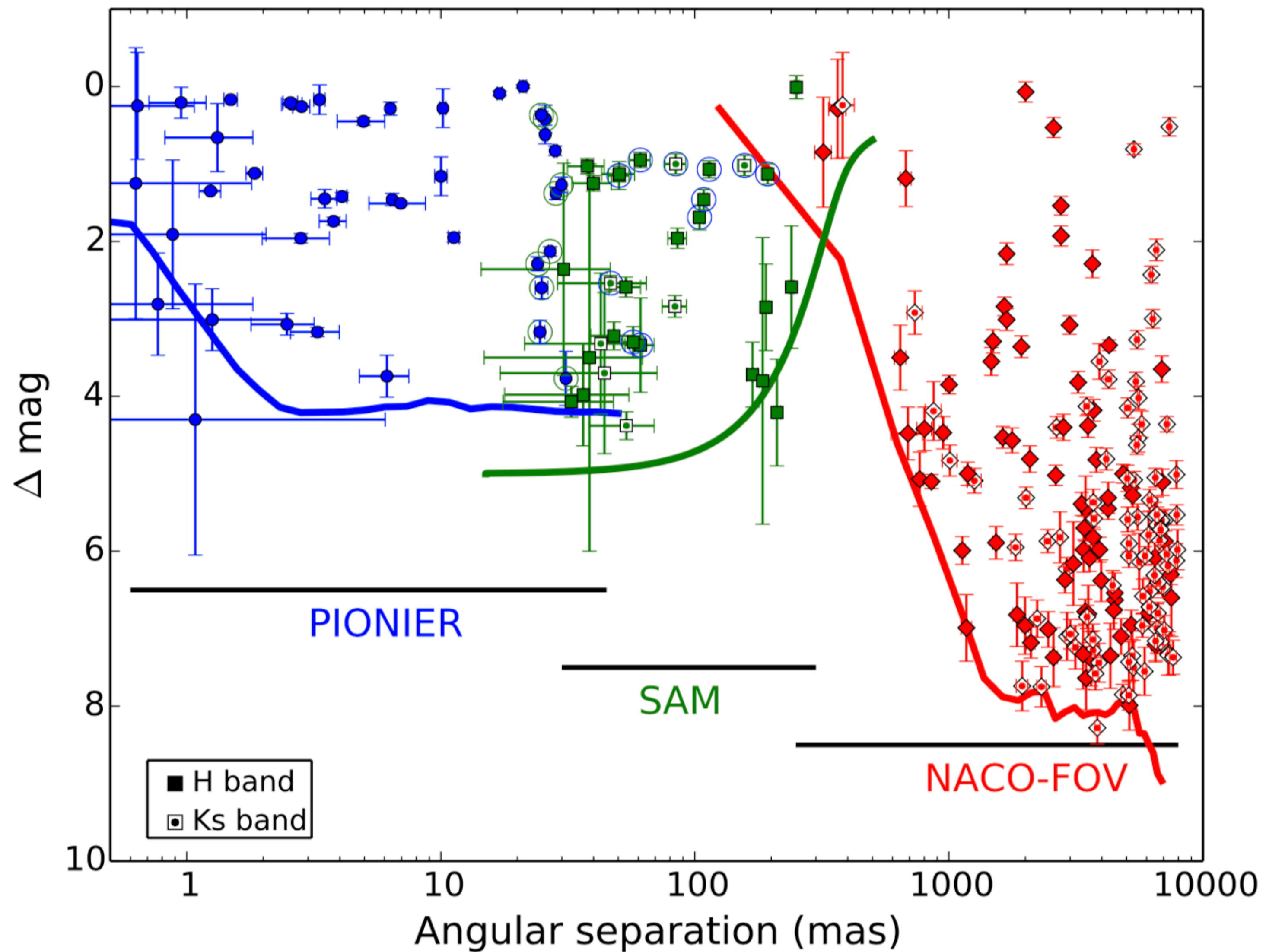


Massive Star Formation

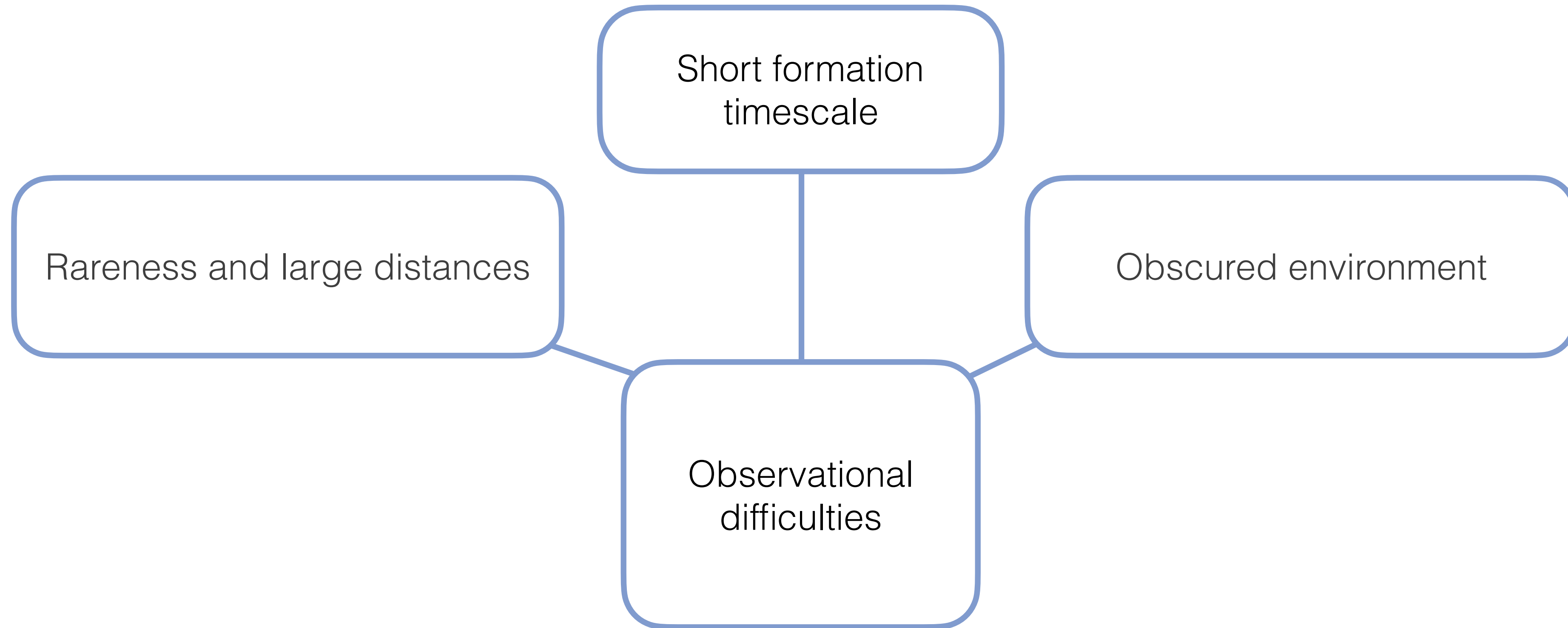


Companion detections (SMaSH+, Sana+, 2014)

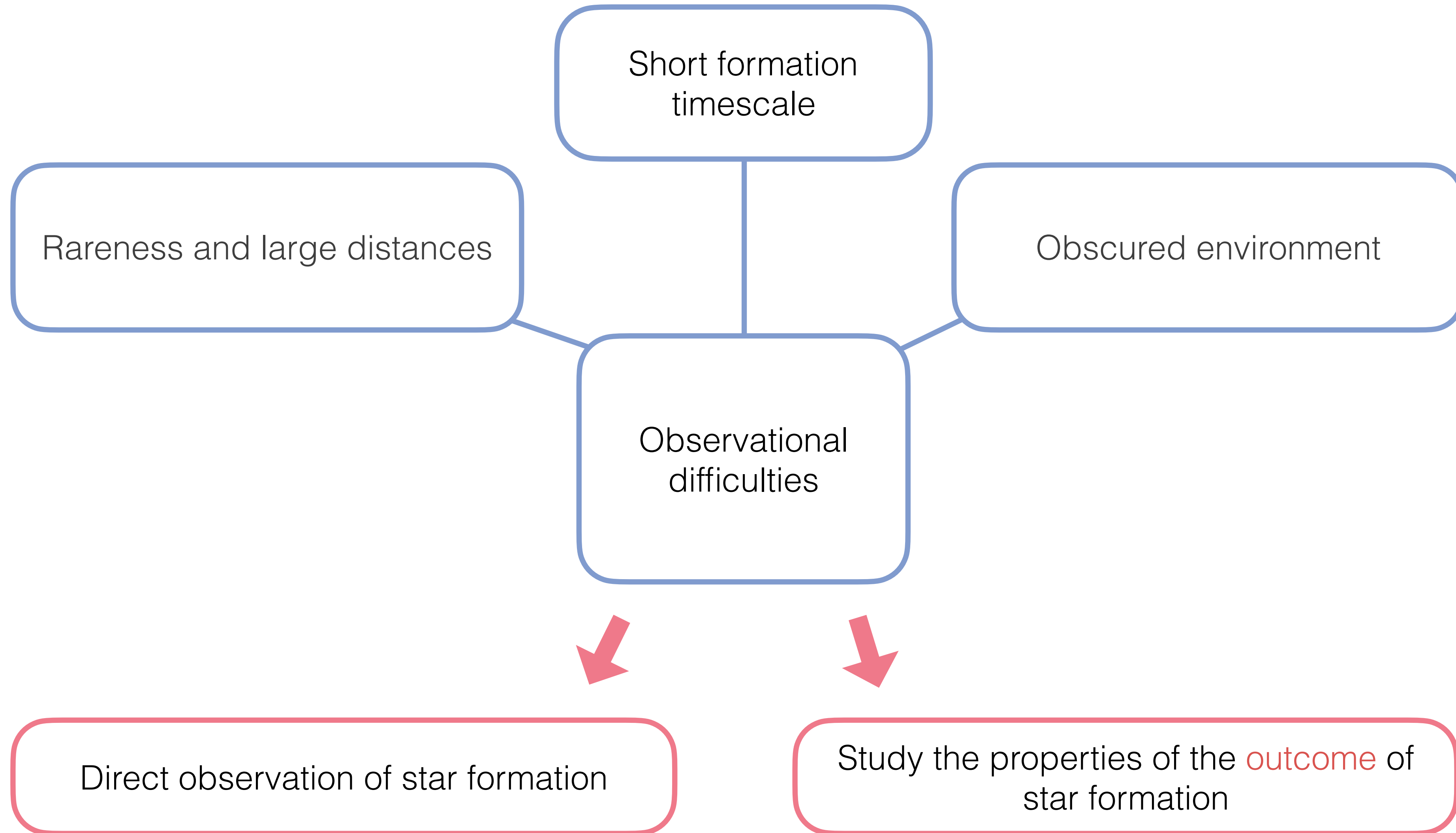
$f_c > 0.9$



Massive Star Formation Problems



Massive Star Formation Problems



High-contrast imaging

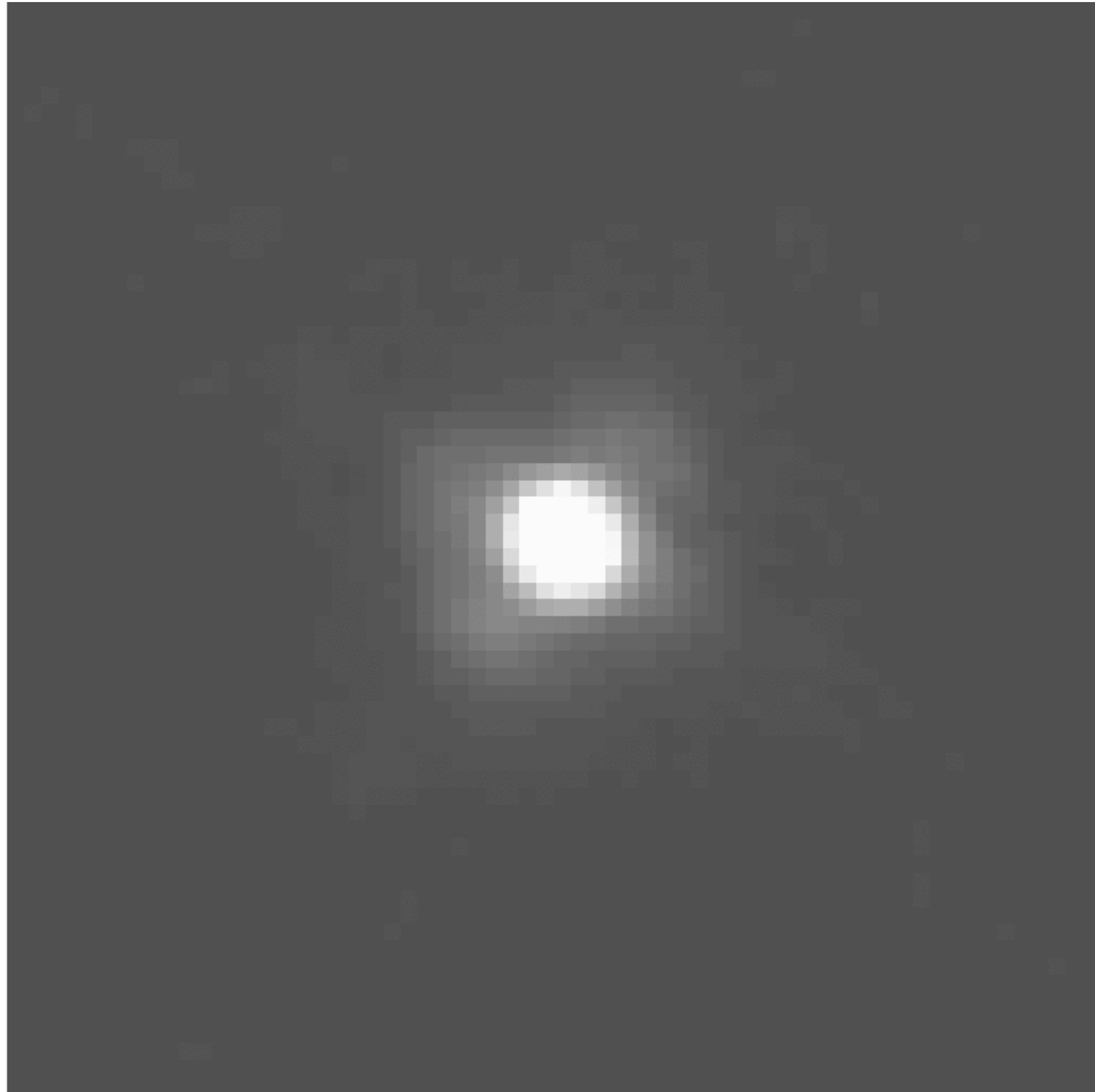


Raw

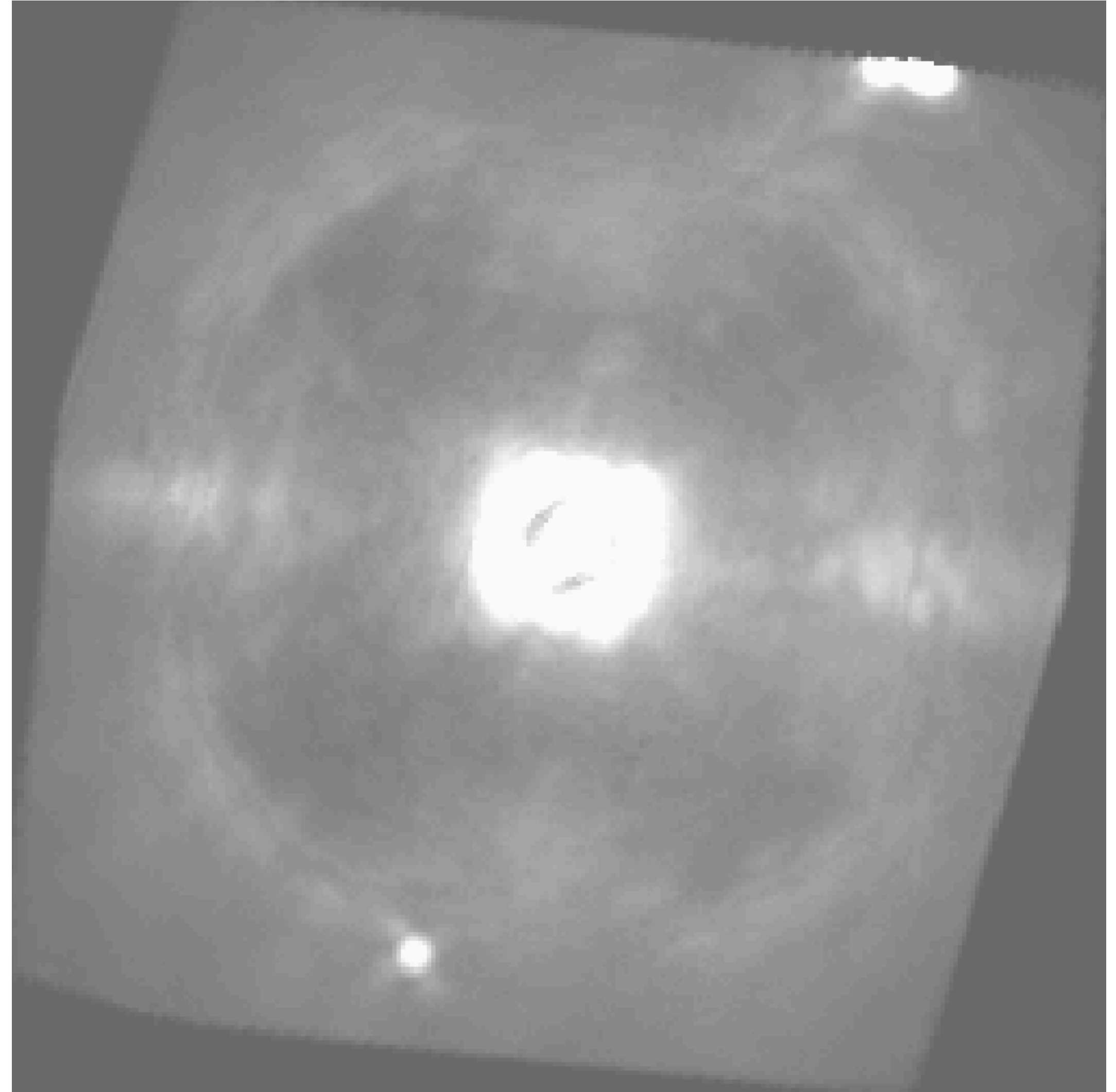


“Coronagraphed” image

Coronagraphy

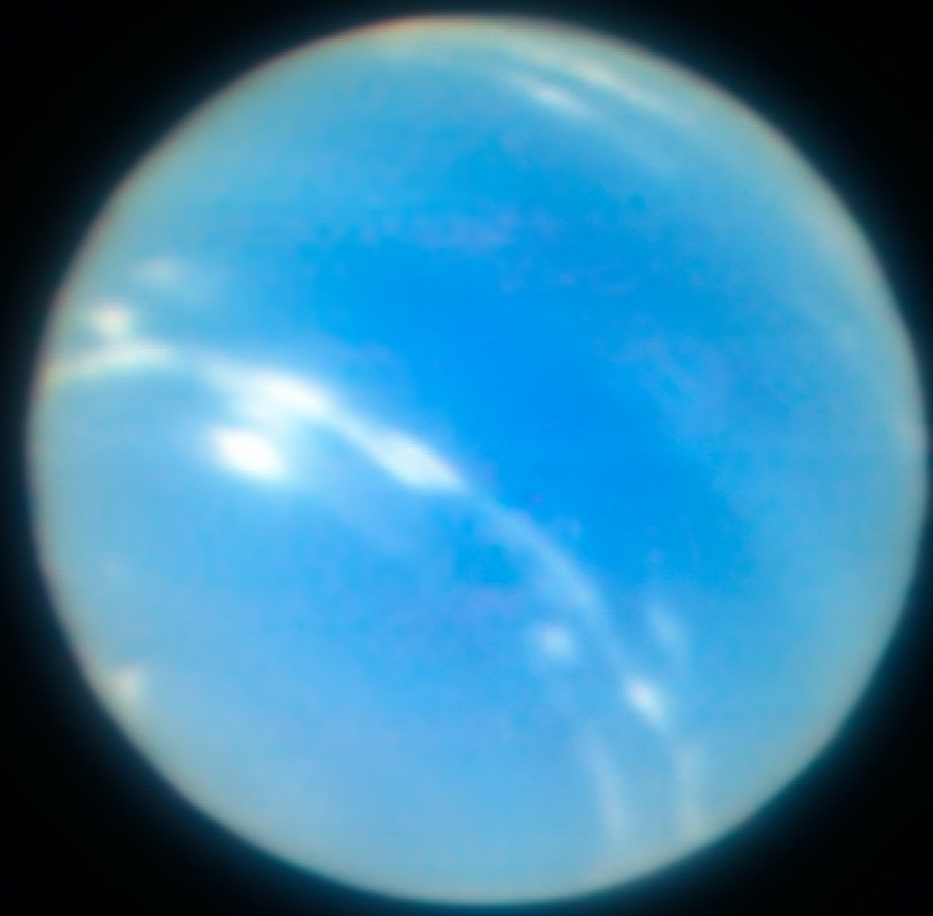


Without coronagraph

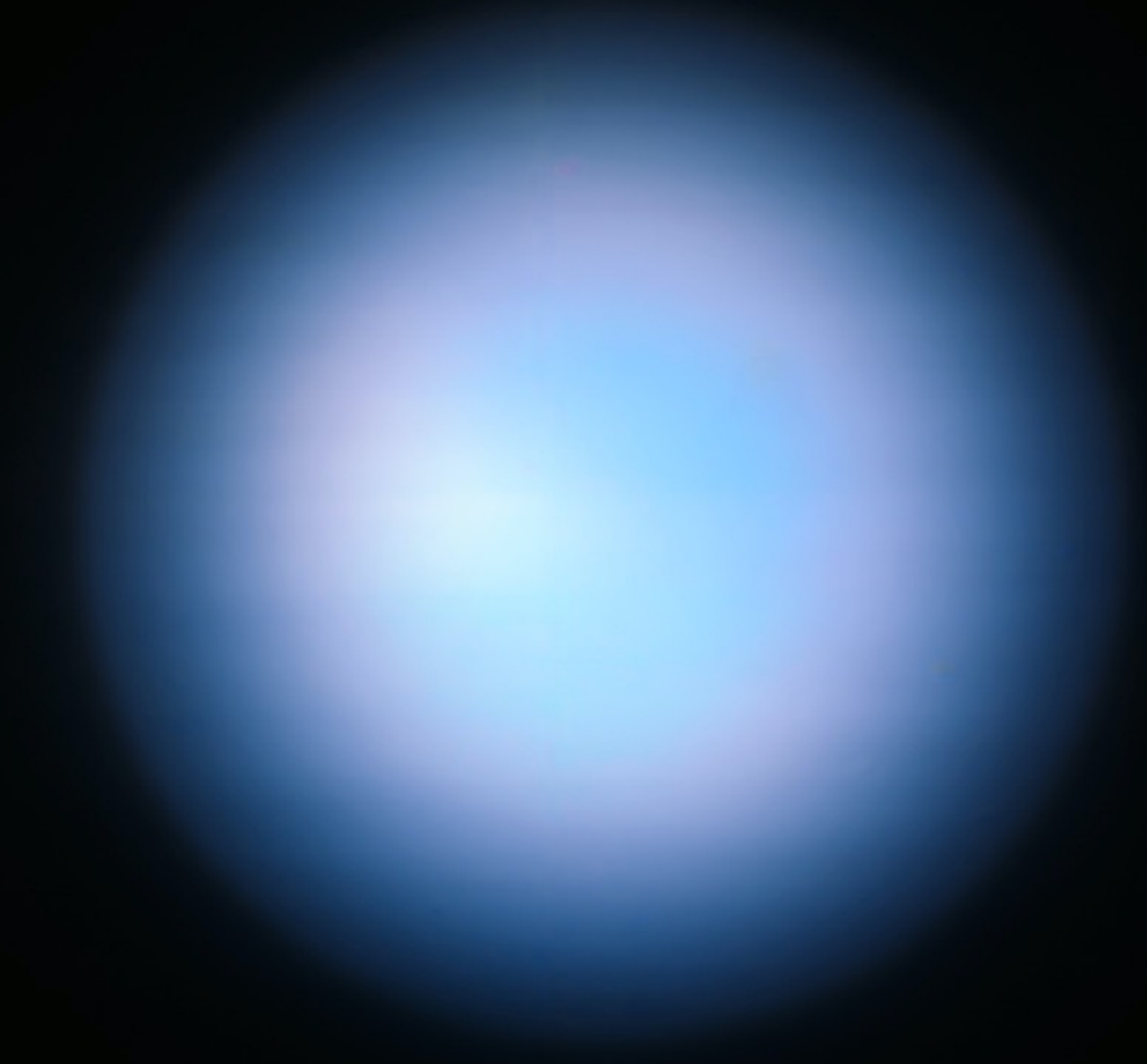


With coronagraph

Adaptive optics

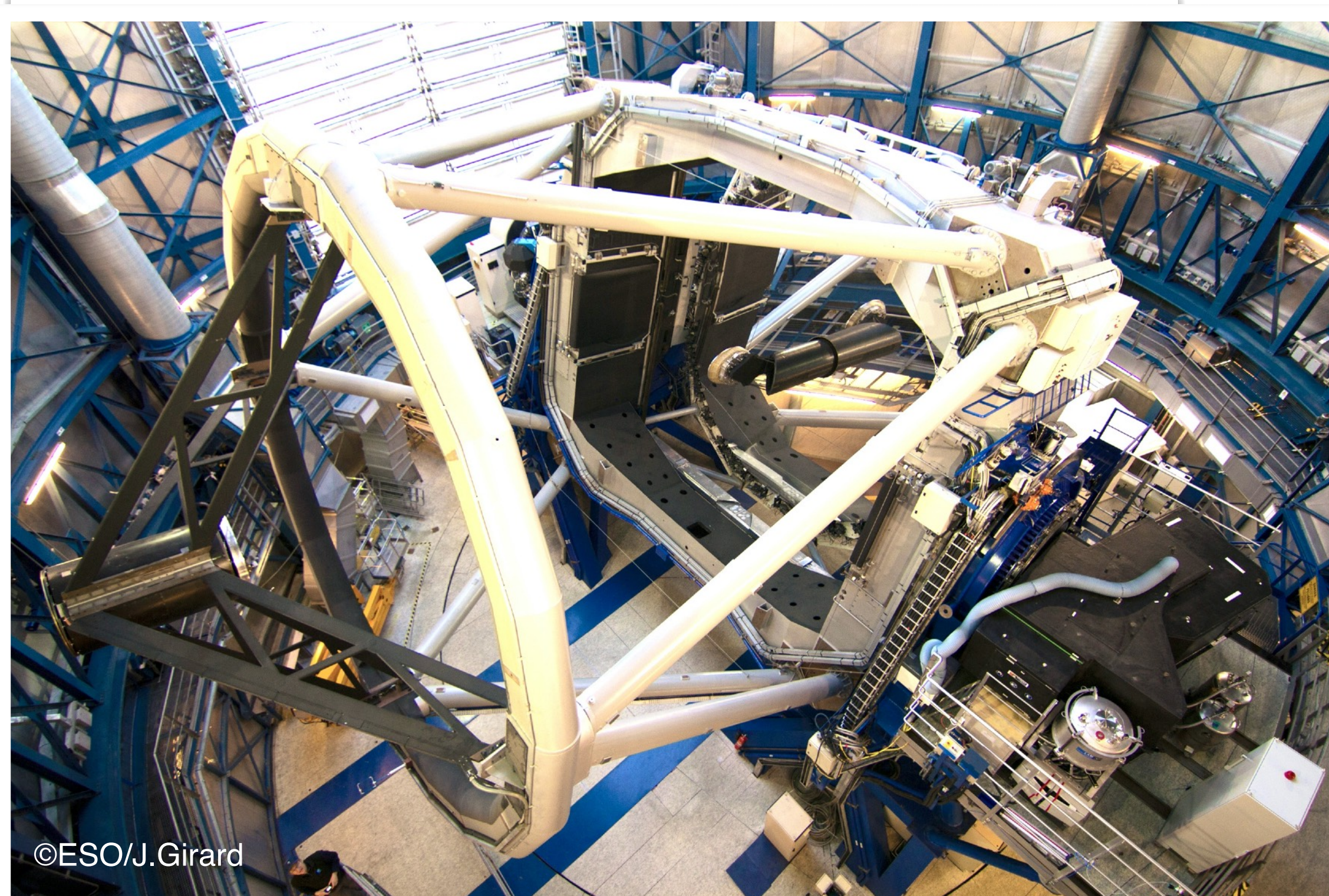


Adaptive optics



No Adaptive optics

SPHERE: Spectro-Polarimetric High-contrast Exoplanet REsearch



SPHERE	IFS	IRDIS
Spectral Range (μm)	0.95-1.75	0.95-2.32
FOV (arcsec^2)	1.73	11
Pixel Scale (marcsec)	7.4	12.25
Bands	Y-J-H	K (1&2)

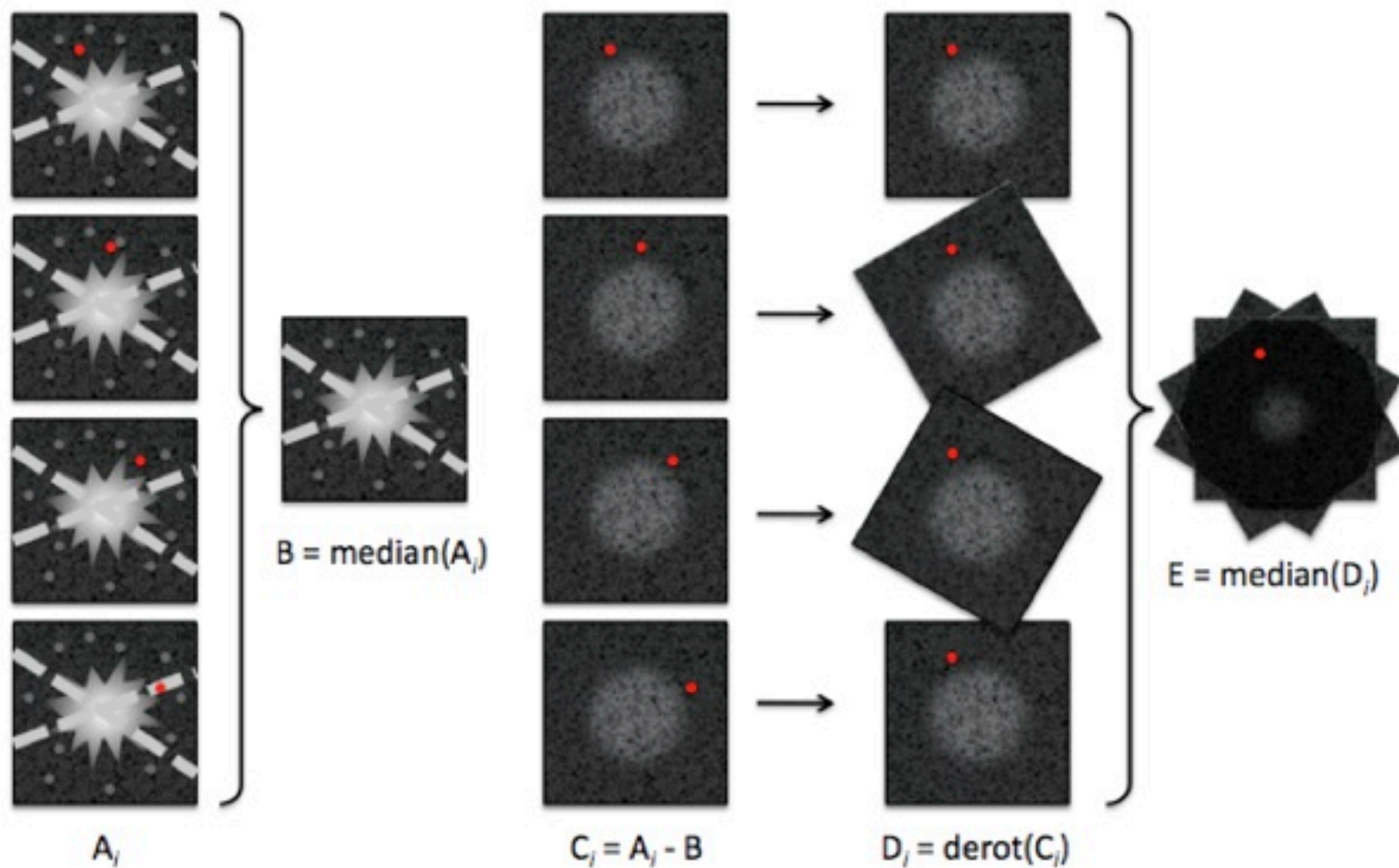


Observing strategy

Observing strategy

- ADI: **Angular** Differential Imaging

ADI (Marois et al., 2006)

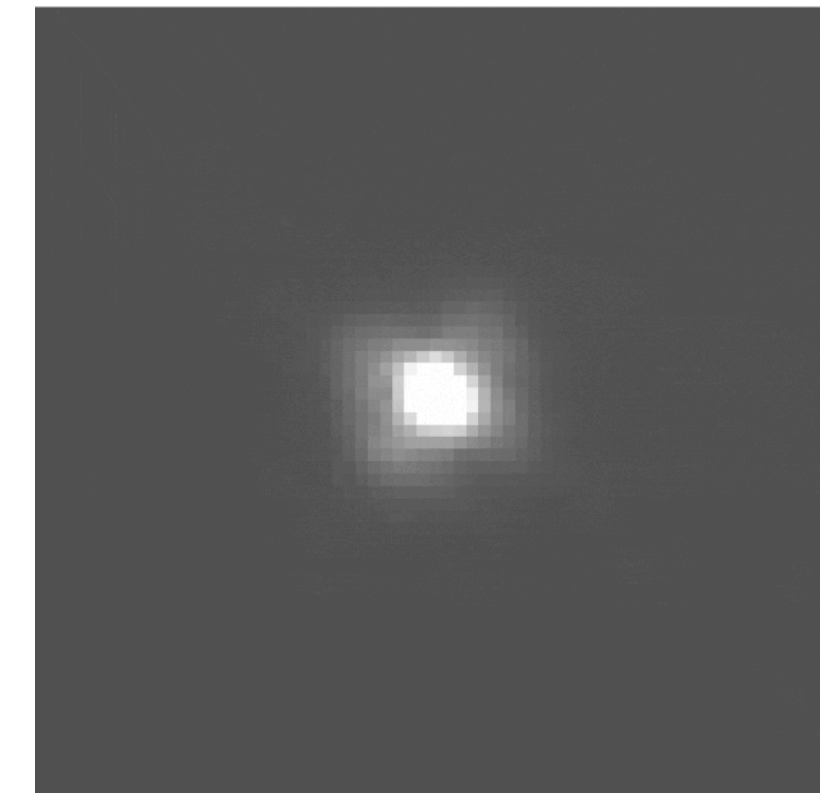
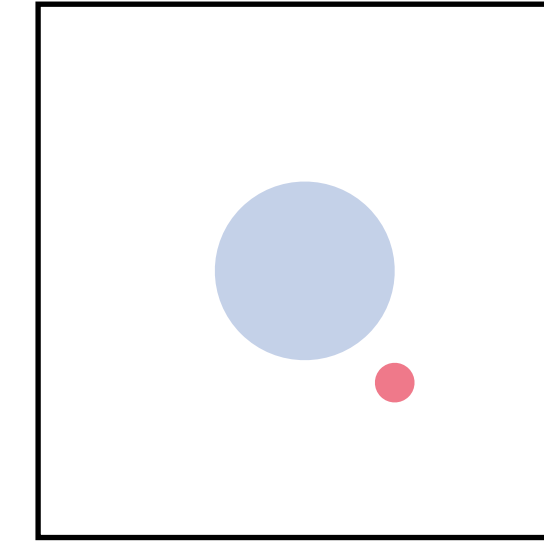
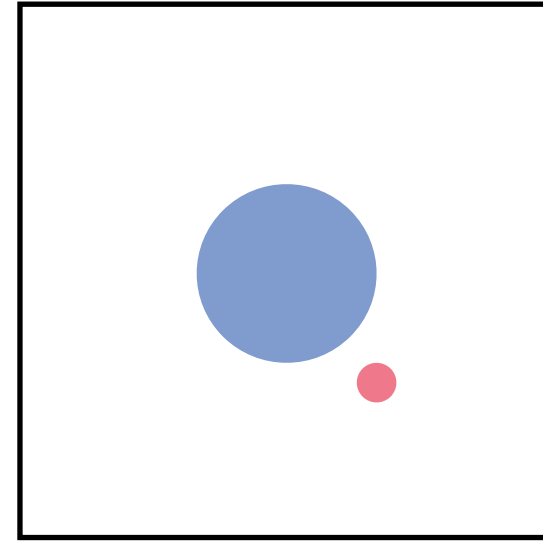
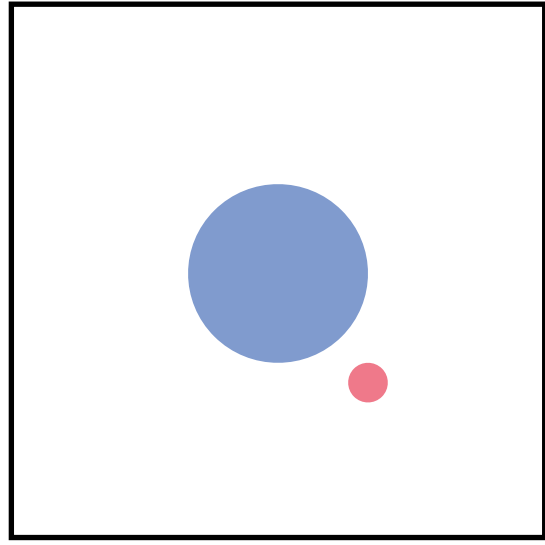


Observing strategy

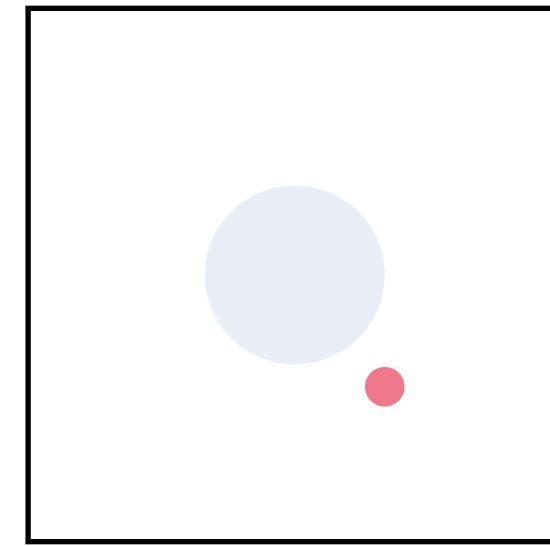
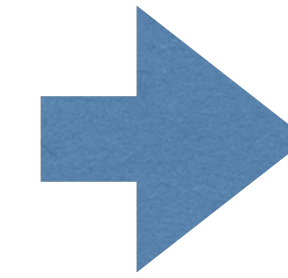
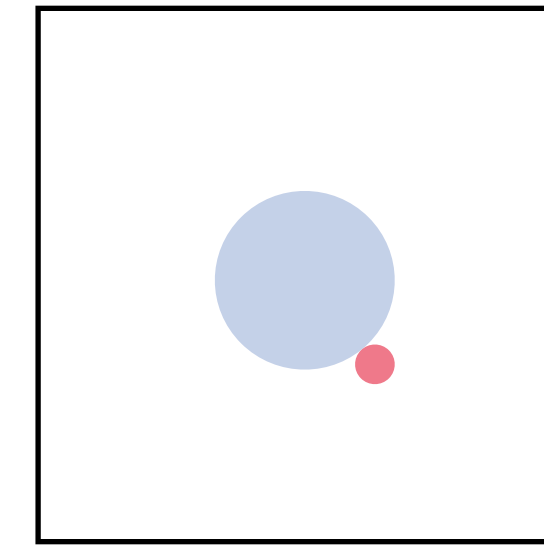
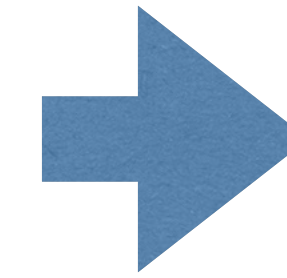
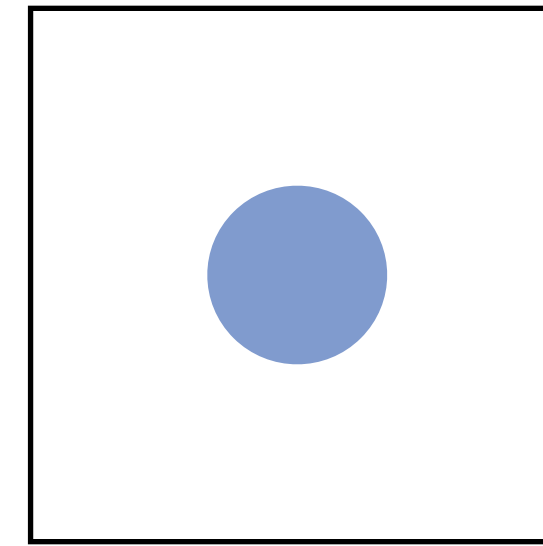
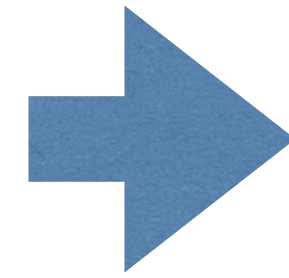
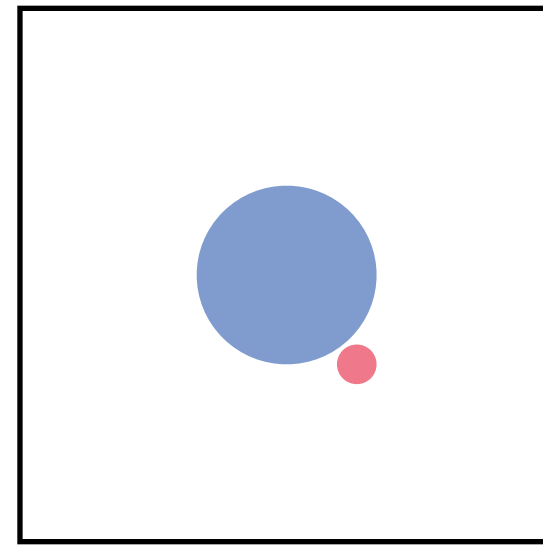
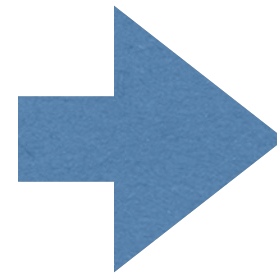
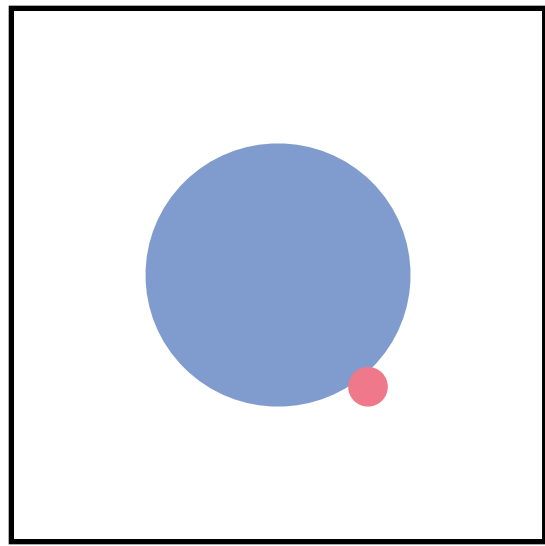
- ADI: **Angular** Differential Imaging
- SDI: **Spectral** Differential Imaging

SDI

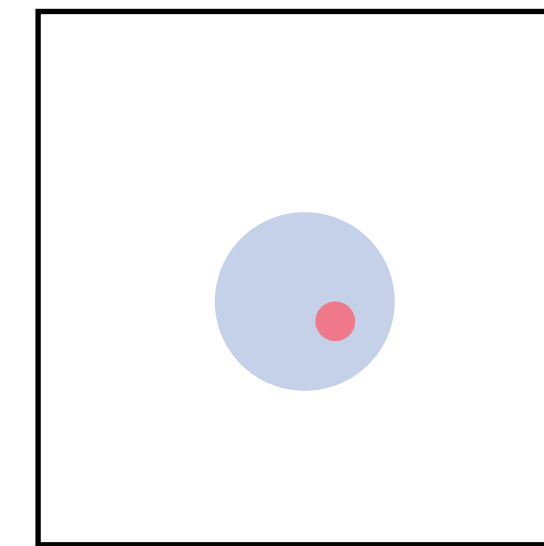
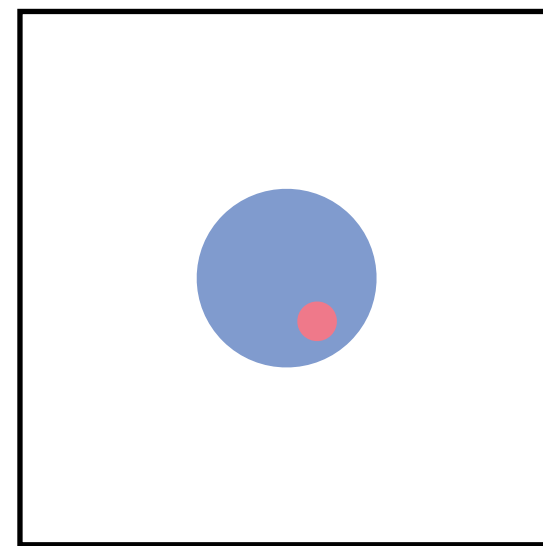
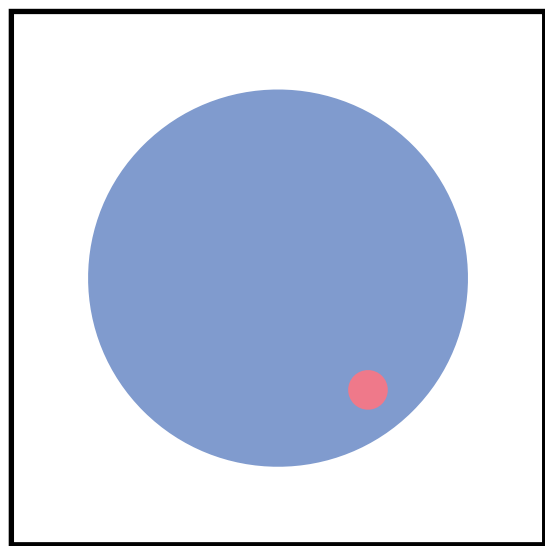
λ_1



λ_2



λ_3



A

B
Scaled

C = median(B)

D = C - B

Rescale+
Combine

Observing strategy

- ADI: **Angular** Differential Imaging
- SDI: **Spectral** Differential Imaging
- RDI: **Reference** star Differential Imaging
- ➔ Vortex Image Processing (VIP) Package: Gomez-Gonzalez et al. 2017
- ➔ pyKLIP: Wang et al. 2015

★ Star 44

[VIP's documentation](#)

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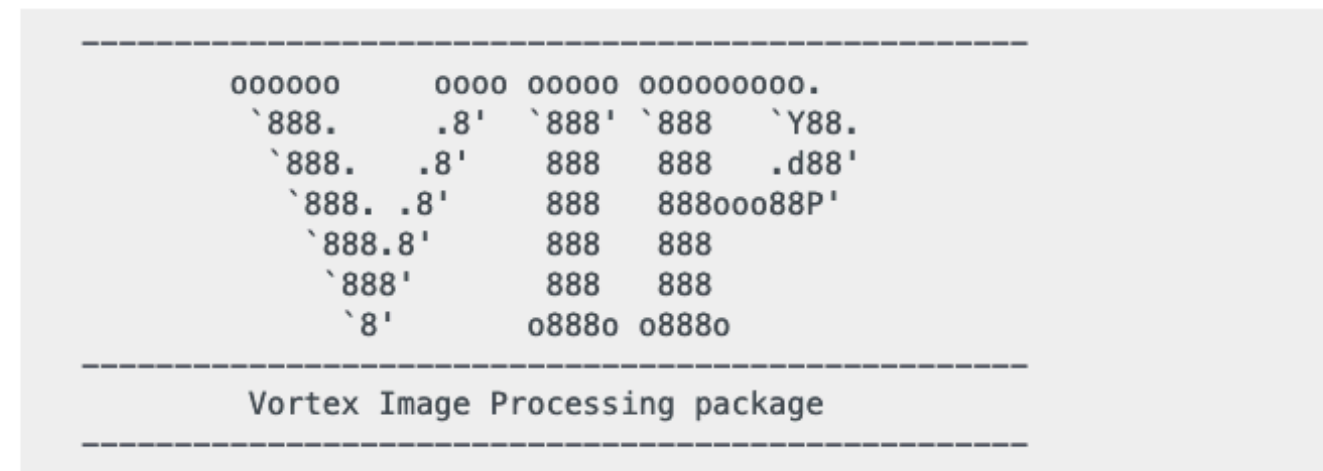
Thank you! ❤️



VIP - Vortex Image Processing package

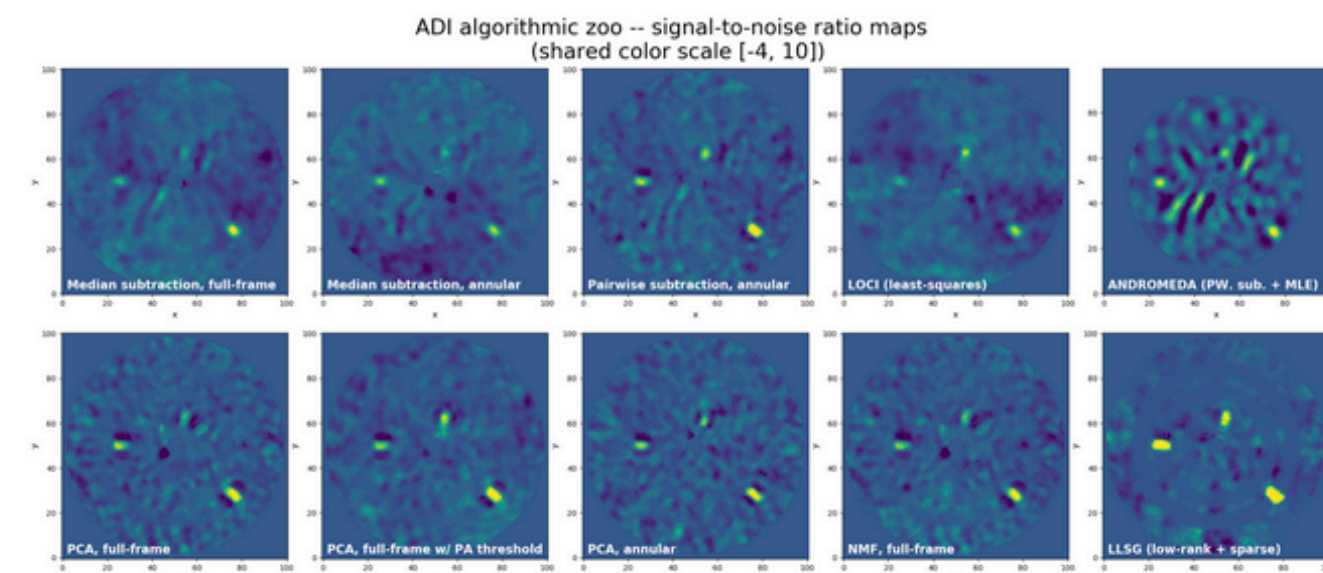
[pypi package 0.9.11](#)
[Python 3.6, 3.7](#)
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[arXiv 1705.06184](#)
[docs passing](#)

[codecov 45%](#)



Introduction

VIP is a python package for angular, reference star and spectral differential imaging for exoplanet and disk high-contrast imaging. VIP is compatible with Python 3 (Python 2 compatibility dropped with VIP 0.9.9).



<https://vip.readthedocs.io>

__pycache__	Code cleanup	8 months ago
LICENSE	Initial commit	2 years ago
PSFfitting.py	Bug fixes	7 months ago
__init__.py	V1.0 release	8 months ago
__init__.pyc	Added basic + contrast curve functionality	2 years ago
readme.rst	Update readme.rst	8 months ago
ships_ifs.py	Added ability to save contrast curve	7 months ago
ships_irdis.py	Added ability to save contrast curve	7 months ago

readme.rst

SHIPS - SPHERE High-contrast Imaging Pipeline for massive Stars

Introduction

SHIPS is a high-contrast imaging pipeline specialising in the study of massive stars. It includes all necessary routines to fully analyse high-contrast imaging frames taken with SPHERE: it enables the detection and position of potential companion candidates and their spectrum extraction.

SHIPS bridges the gaps between the image processing algorithms from the state-of-the-art software VIP (<https://github.com/carlgogo/vip-tutorial>) and the scientific user. It aims to be a simple to use reduction pipeling to analyse and process images.

It is still under active development and is modified daily. Currently at version 1.0.

VIP is a package/pipeline for angular, reference star and spectral differential imaging for exoplanet/disk detection through high-contrast imaging. VIP is being developed in Python 3+.

Documentation

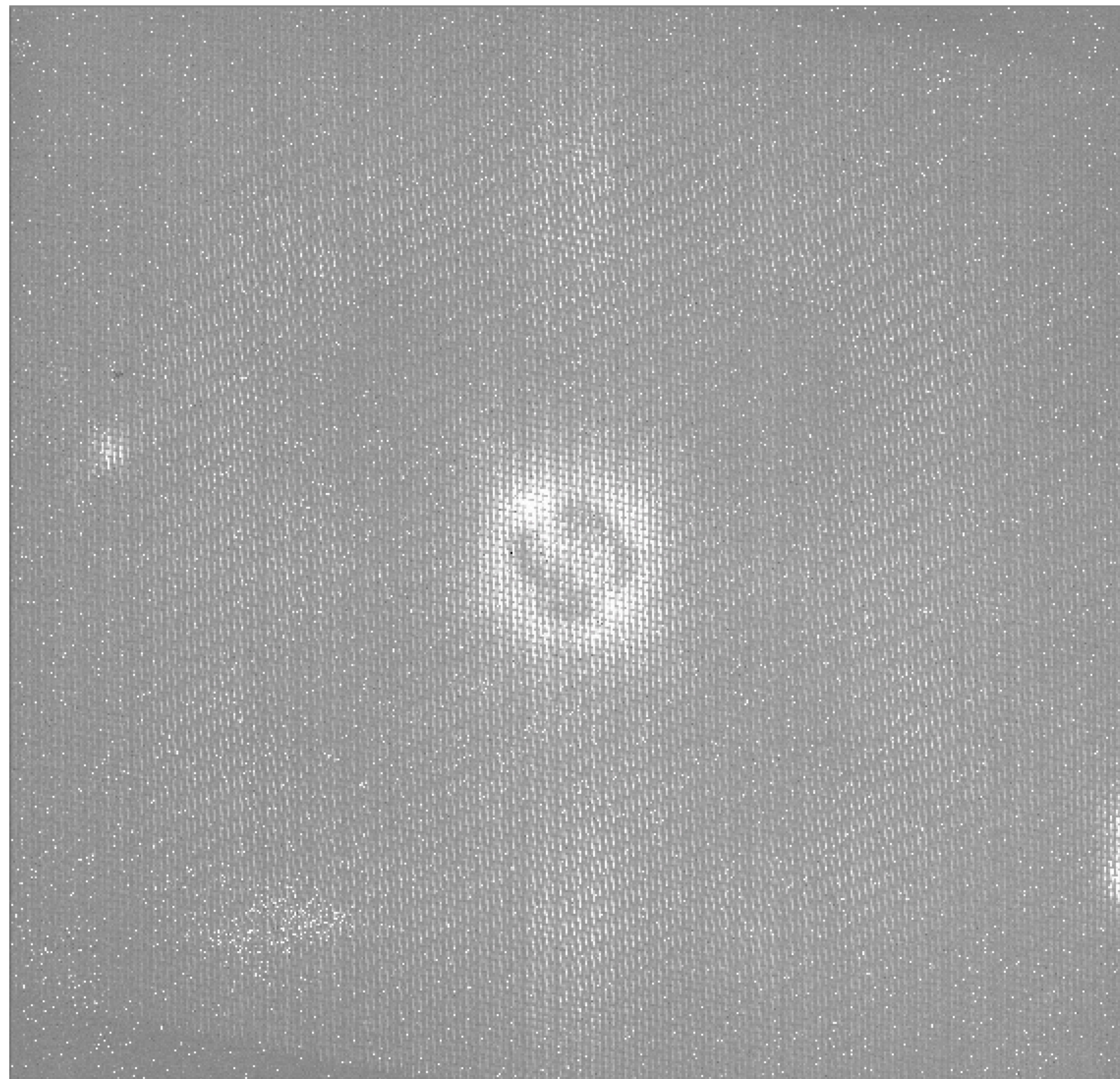
Documentation for VIP can be found in <http://vip.readthedocs.io/>.

<https://github.com/arainot>

```
#####  
# Date: 07/08/2019~  
# Title: Running script for SHIPS for IFS data~  
# Description: Use this script to run SHIPS for IFS data. In this script you'll find all the necessary parameters to run SHIPS. ONLY SPHERE-DC DATA FOR NOW. VIP are used.~  
# VIP version: 0.9.11 (Rainot edit.)~  
# Python version: 3 ONLY~  
#####~  
|  
# Set up your parameters~  
|  
## Define images to analyse~  
cube_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/QZCardone/ifs_sortframes_dc-IFS_SCIENCE_REDUCED_SPECTRAL_MASTER_CUBE_SORTED-center_im_sorted.fits'~  
cube_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/QZCardone/cube_free_Ad.fits'~  
wavelength_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/QZCardone/ifs_sortframes_dc-IFS_SCIENCE_LAMBDA_INFO-lam.fits'~  
angles_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/QZCardone/ifs_sortframes_dc-IFS_SCIENCE_PARA_ROTATION_CUBE_SORTED-rotnth_sorted.fits'~  
psf_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/QZCardone/psf_corrected_final.fits'~  
# wavelength_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/HD93403/ifs_sortframes_dc-IFS_SCIENCE_LAMBDA_INFO-lam.fits'~  
# cube_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/HD93403/ifs_sortframes_dc-IFS_SCIENCE_REDUCED_SPECTRAL_MASTER_CUBE_SORTED-center_im_sorted.fits'~  
# angles_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/HD93403/ifs_sortframes_dc-IFS_SCIENCE_PARA_ROTATION_CUBE_SORTED-rotnth_sorted.fits'~  
# psf_filepath = '/home/alan/data/Backup_macbook/SPHERE/IFS/HD93403/ifs_sortframes_dc-IFS_SCIENCE_PSF_MASTER_CUBE-median_unsat.fits'~  
|  
## Photometry~  
comp_pos = (110.,54.) # Companion position in pixels from the center of the frame (X,Y)~  
psf_pos = (32, 32) # PSF position in pixels (X,Y)~  
frame_cent = (145,145) # Center of the frame~  
radial_dist = 98 # Radial distance of companion in pixels~  
position_angle = 159. # Position angle of companion in degrees~  
noise_aperture_pos_comp = (92,104) # Position in pixels of the circular annulus aperture for noise measurement in the case of the companion~  
noise_aperture_pos_psf = (12,22) # Position in pixels of the circular annulus aperture for noise measurement in the case of the PSF~  
size_psf = 31 # What size PSF would you like to use? ODD VALUE ONLY!!~  
|  
|  
## Computing power~  
ncores = 4 # Number of cores you are willing to share for the computation~  
|  
## Do you want to see the image?~  
see_cube = False # Original cube~  
see_collapsed_cube = False # Collapsed cube~  
see_psf_norm = False # Normalised PSF~  
see_cube_centre = False # Check if the image is centered correctly~  
|  
## PCA~  
ncomp_pca = 0 # Number of principal components for PCA~  
opti_pca = False # Optimise the number of PCA components?~  
source_pca = (82.,116.) # Source where to optimise the PCA~  
|  
## SNR maps~  
snr_maps = False # Would you like to make and save an SNR map to disk?~  
snr_map_file = '/home/alan/data/Backup_macbook/SPHERE/IFS/QZCardone/SNRmap_VIP11.fits' # Finish the file with .fits~  
|  
## Detection~  
adi_frame = False # Would you like to apply ADI on the frame?~  
adi_plot = False # Would you like to see the resulting plot?~  
adi_min_scale = -1 # Minimum colour scale for the ADI plot~  
adi_max_scale = 1 # Maximum colour scale for the ADI plot~  
detection = False # Would you like the algorithm to detect sources for you? !! WARNING: this is a simple detection !!~  
|  
detect_sigma = 5 # What sigma limit would you like for the detection?~  
|  
## Contrast curves~
```

Data Reduction

Raw frame



26-01-2016

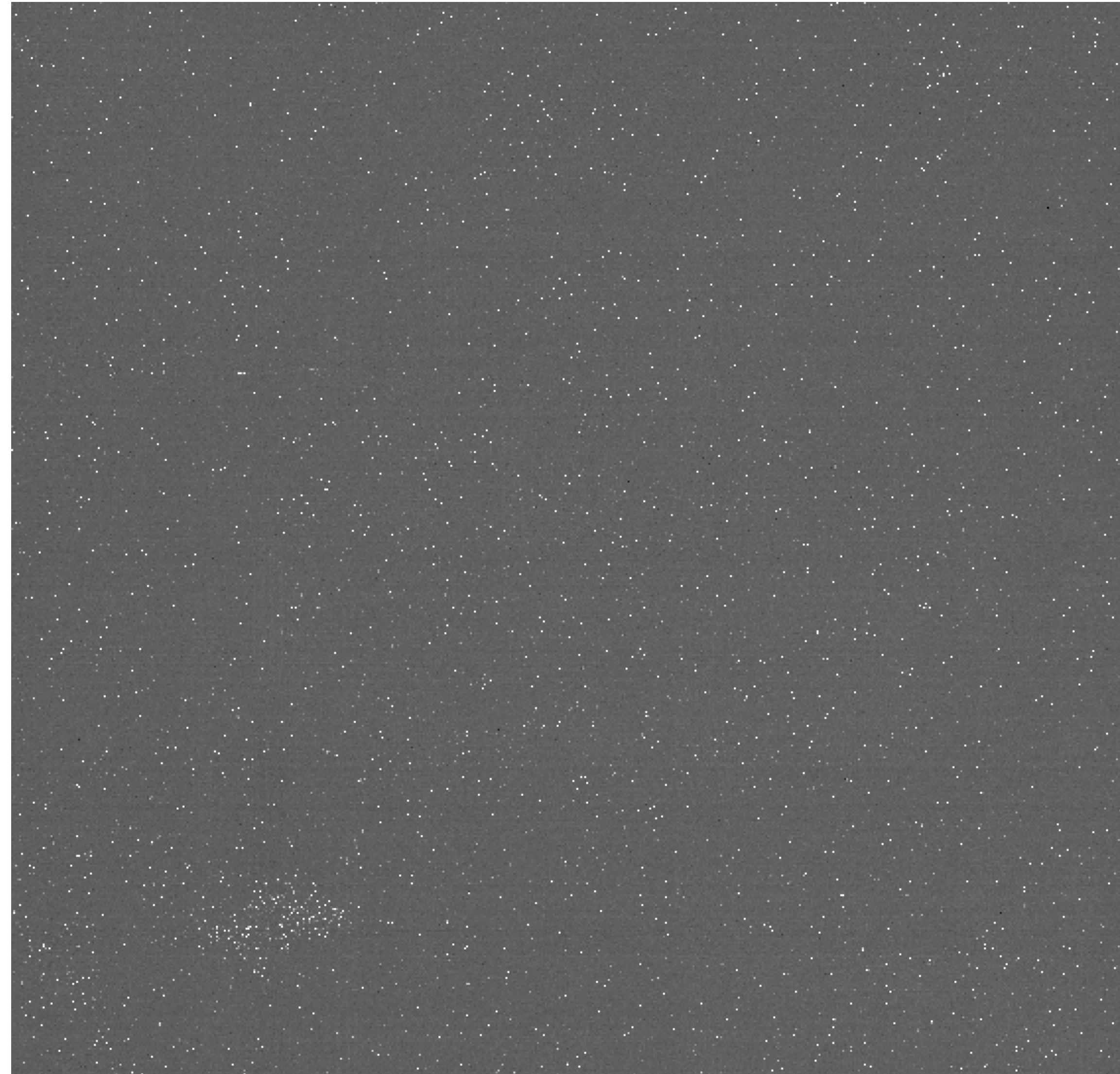
Dark frame

Detector flat-field

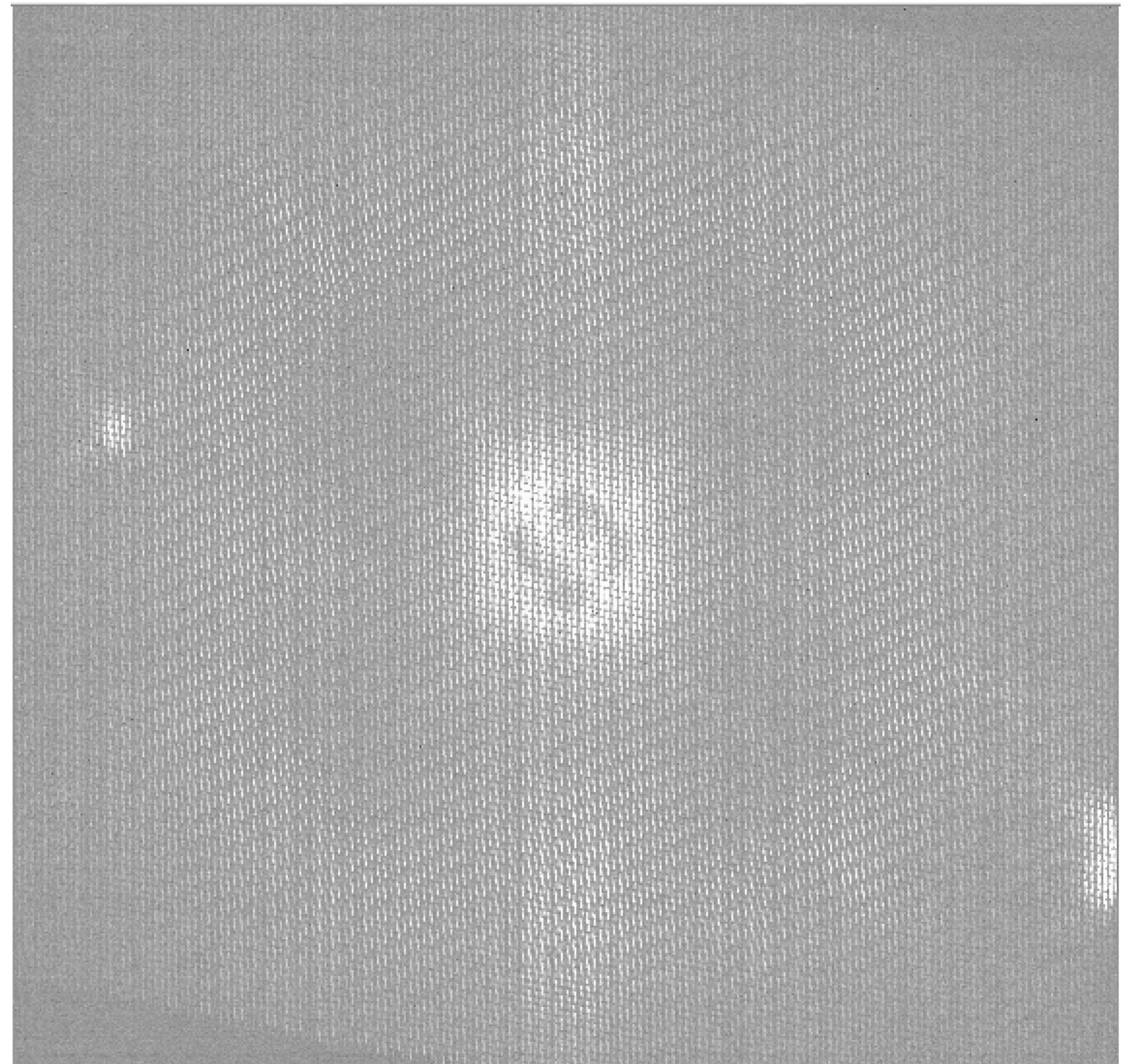
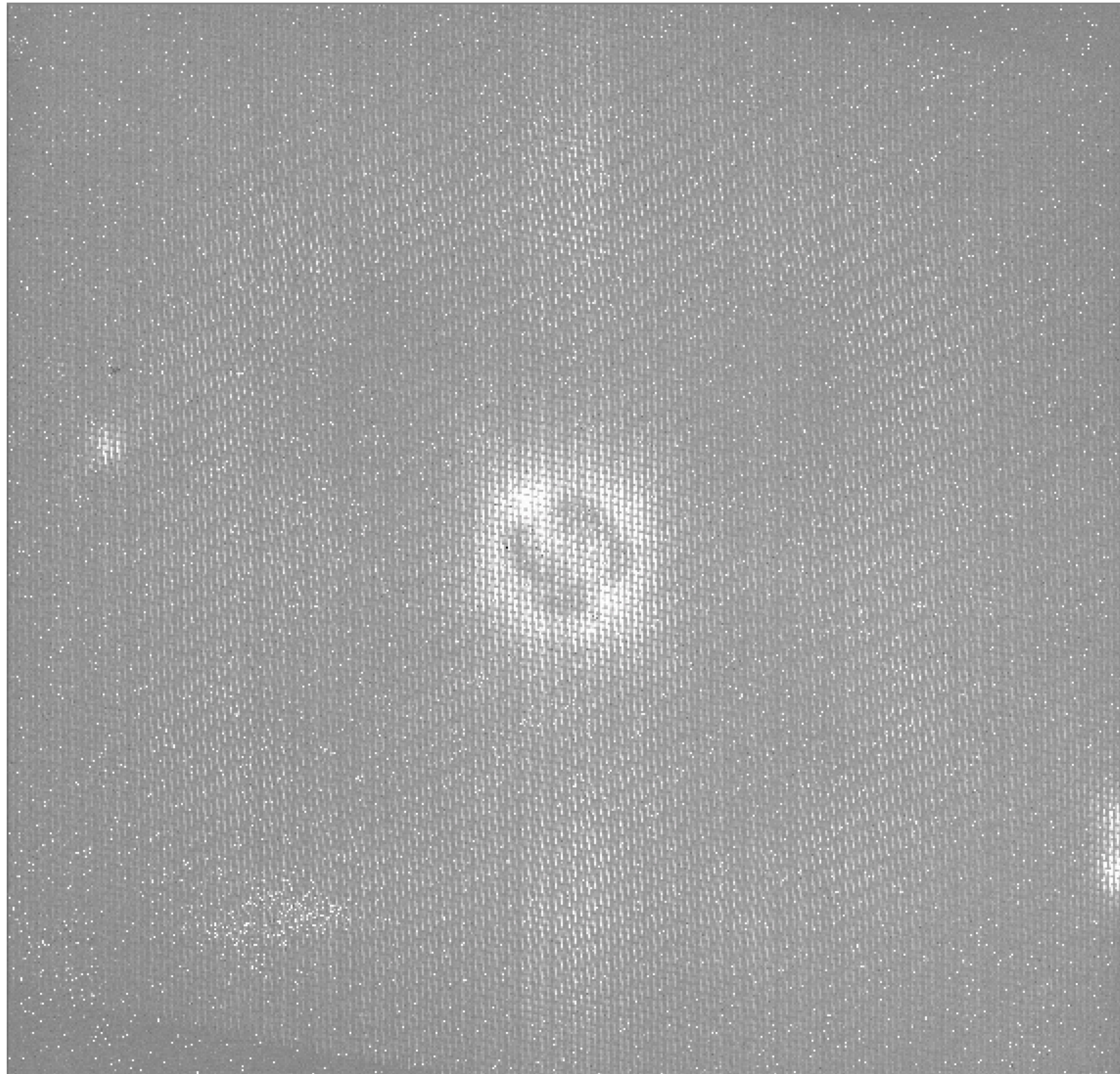
Wavelength calibration

Combination of input frames

Dark frame



Bad pixel + dark correction



Dark frame

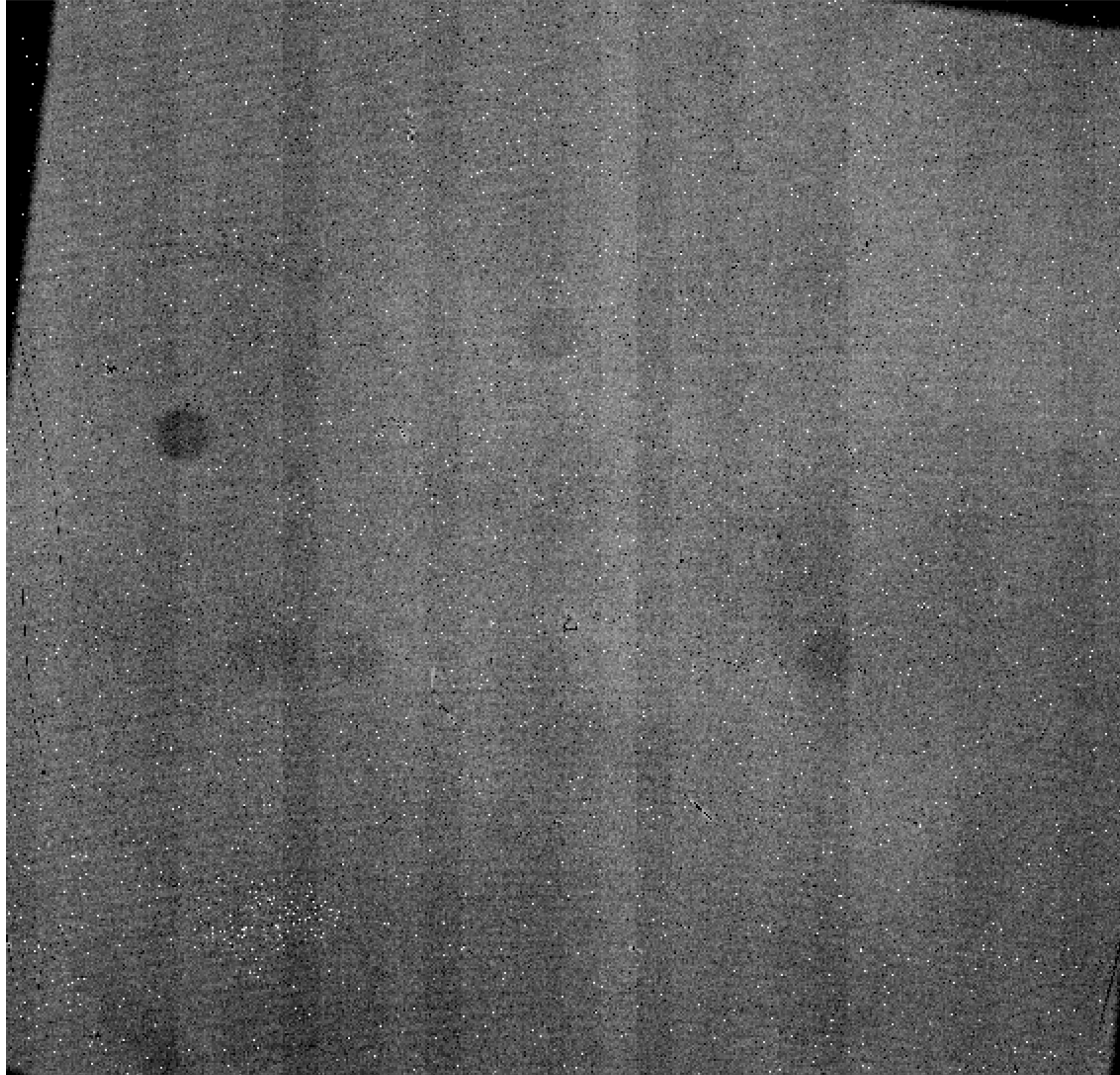


Detector flat-field

Wavelength calibration

Combination of input frames

Flat-field



Dark frame



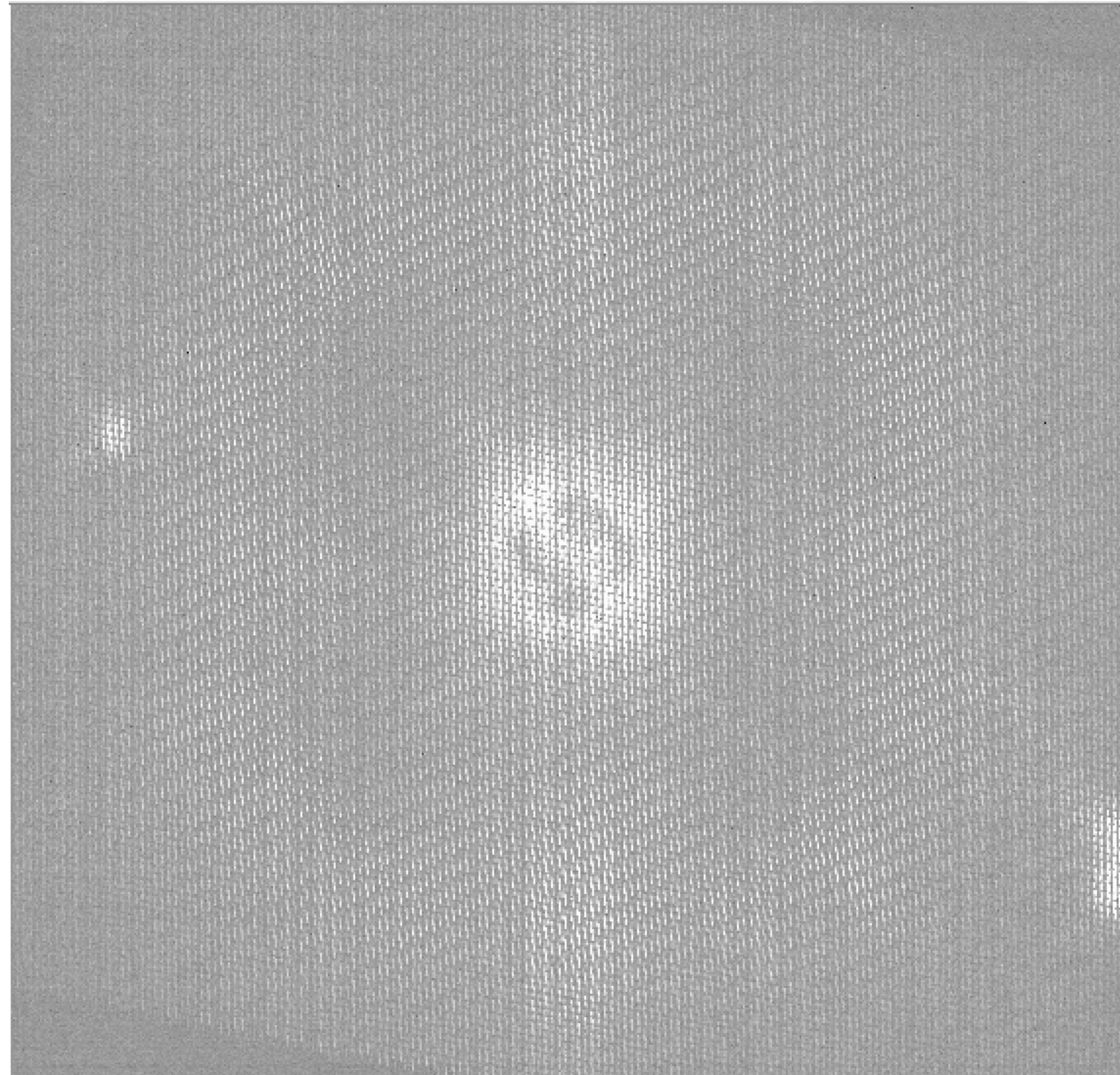
Detector flat-field



Wavelength calibration

Combination of input frames

Wavelength calibration



Dark frame



Detector flat-field

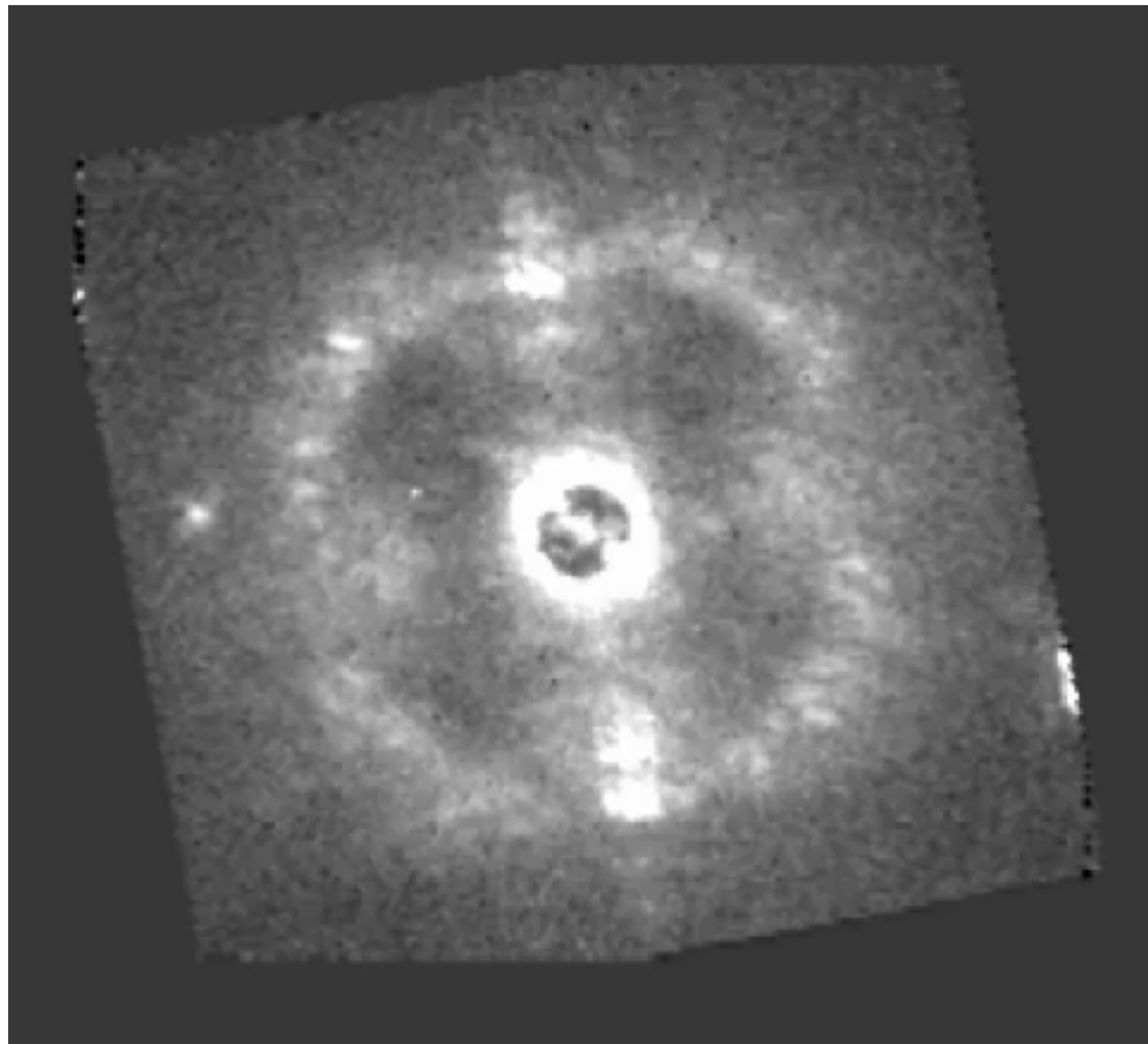


Wavelength calibration

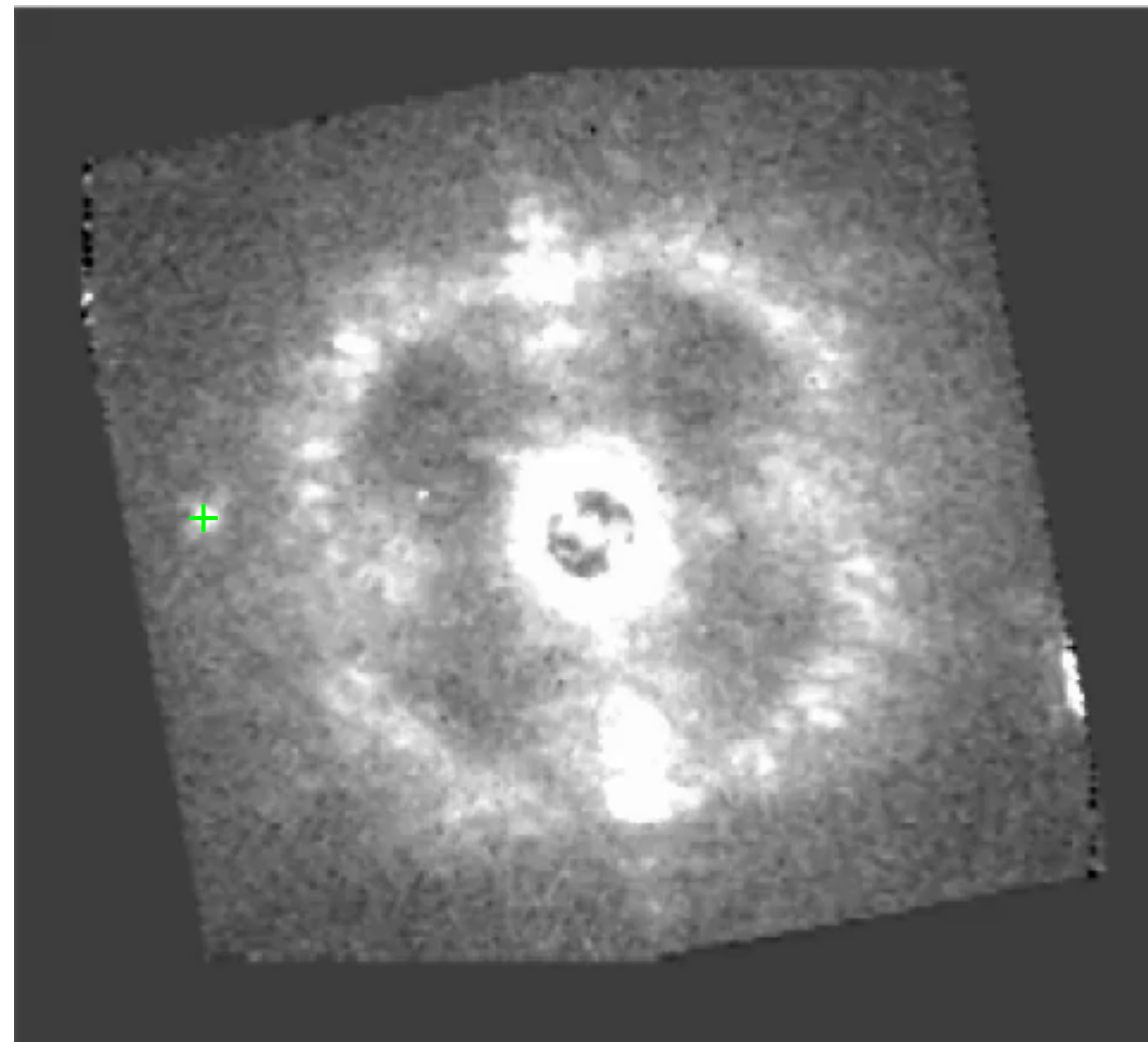


Combination of input frames

Reduced IFS data



39 Wavelengths



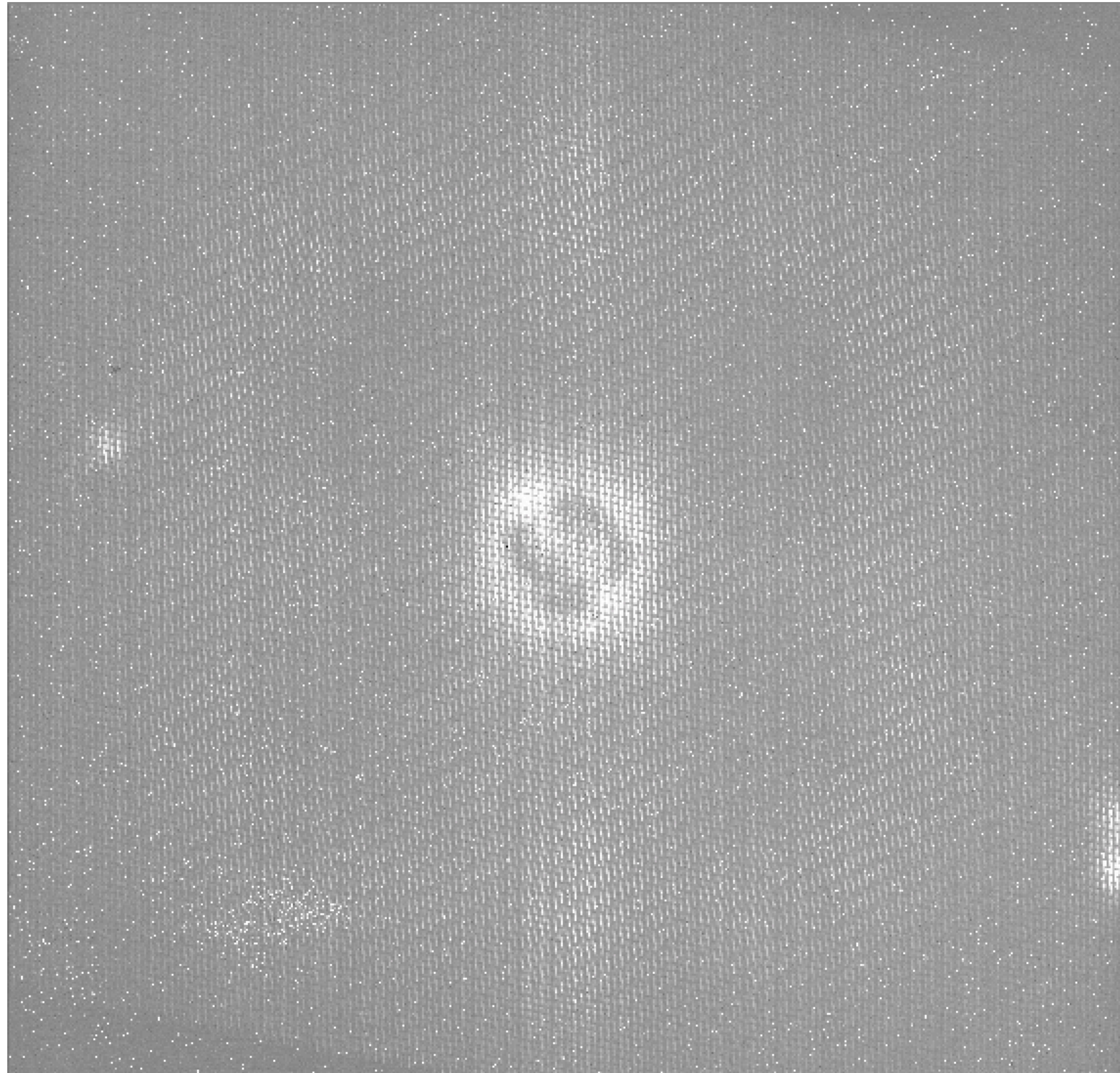
48 rotations

Data Analysis

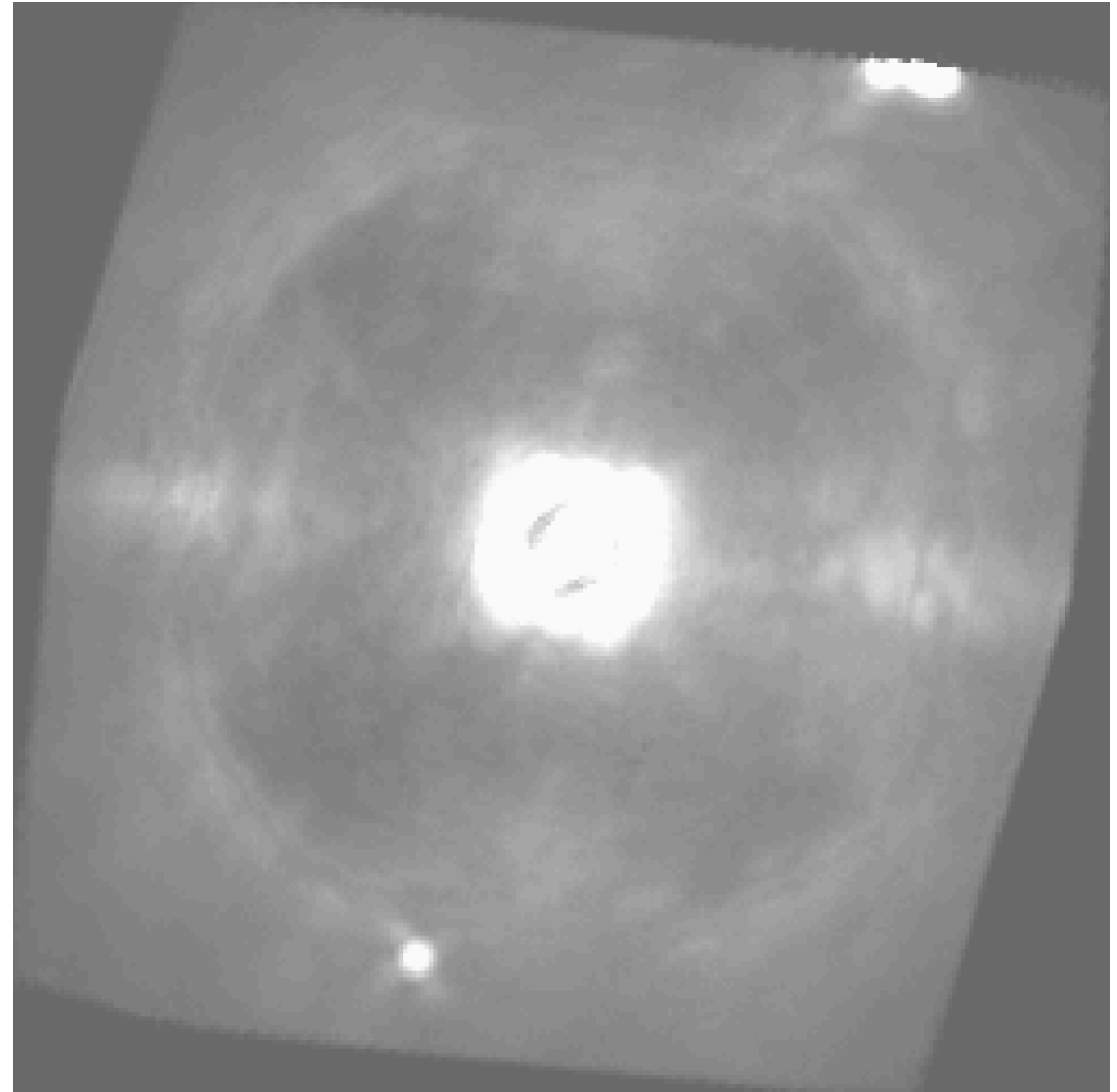
Analysis Techniques

- ADI: **Angular** Differential Imaging
- SDI: **Spectral** Differential Imaging
- RDI: **Reference** star Differential Imaging
- ▶ PCA: **Principal Component Analysis**
 - ▶ Reference PSF subtraction
 - ▶ Spectrum Extraction

IFS

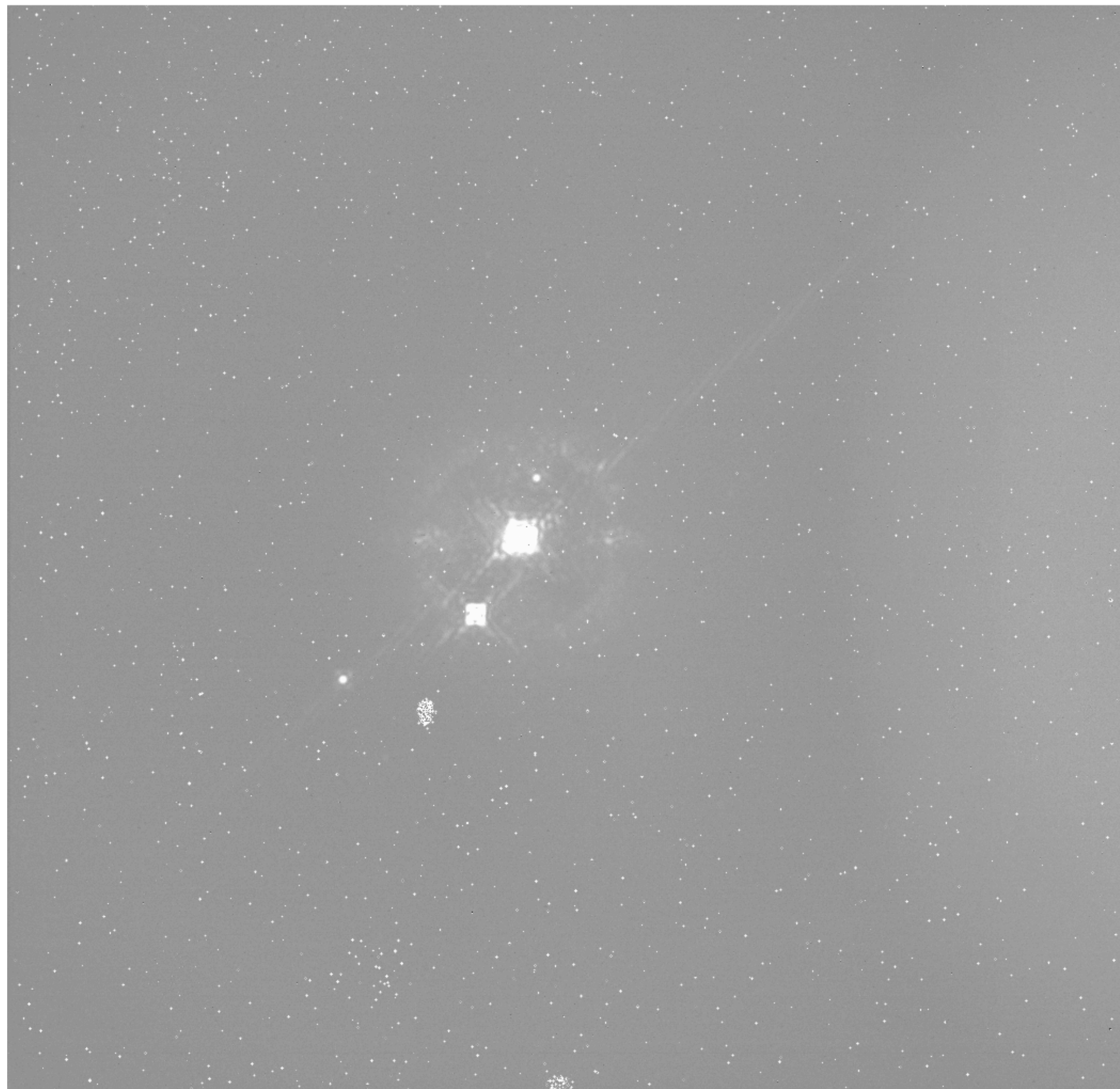


Raw image

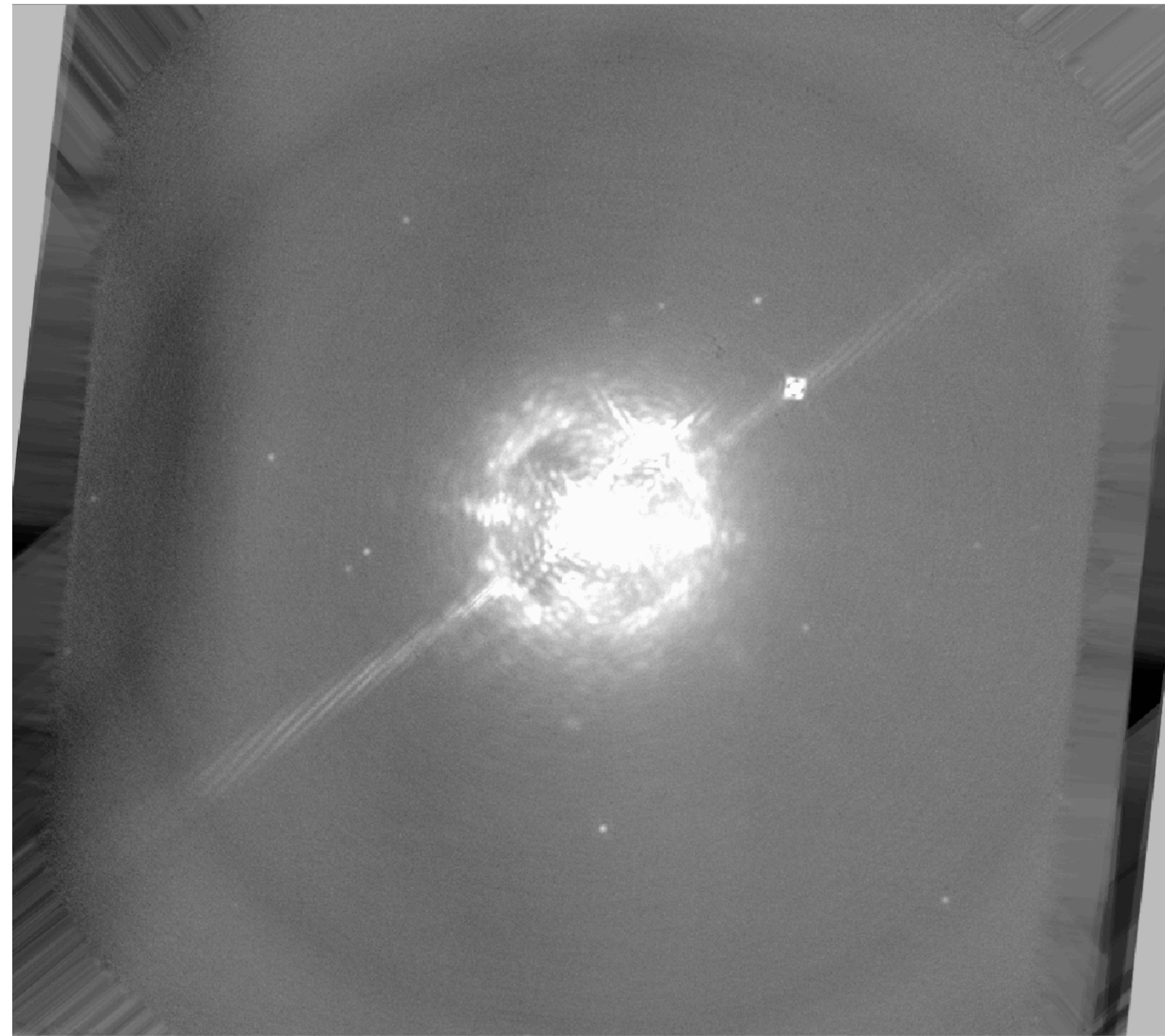


Post-processed image

IRDIS



Raw image



Post-processed image

C H I P S

C H I P S

Carina **H**igh-contrast **I**maging **P**roject of massive **S**tars

C

H



S

Carina

close massive star
region

C H I P S

High-contrast Imaging

VLT/SPHERE
@ESO

46 stars already reduced

47 stars planned

C H I P S

Project of massive **S**tars

Multiplicity
properties of 93
massive stars

faint and low-mass
companions

Carina High-contrast Imaging Project for massive Stars (CHIPS)

I. Methodology and proof of concept on QZ Car (\equiv HD 93206)

A. Rainot¹, M. Reggiani¹, H. Sana¹, J. Bodensteiner¹, C. A. Gomez-Gonzalez², O. Absil^{3,*}, V. Christiaens^{3,4,5},
P. Delorme⁶, L. A. Almeida^{7,8}, S. Caballero-Nieves⁹, J. De Ridder¹, K. Kratter¹⁰, S. Lacour¹¹, J.-B. Le Bouquin⁶,
L. Pueyo¹², and H. Zinnecker¹³

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² Barcelona Supercomputing Center, carrer de John Maynard Keynes, 30, 08034 Barcelona, Spain

³ Space sciences, Technologies and Astrophysics Research (STAR) Institute, Université de Liège, 19 Allée du Six Août,
4000 Liège, Belgium

⁴ Departamento de Astronomía, Universidad de Chile, Casilla 36-D, Santiago, Chile

⁵ School of Physics and Astronomy, Monash University, VIC 3800, Australia

⁶ Université Grenoble Alpes, CNRS, IPAG, 38000 Grenoble, France

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⁸ Departamento de Física Teórica e Experimental, Universidade Federal do Rio Grande do Norte, CP 1641, Natal,
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France

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¹³ Universidad Autonoma de Chile, Avda Pedro de Valdivia 425, Providencia, Santiago de Chile, Chile

Received 2 August 2019 / Accepted 27 May 2020

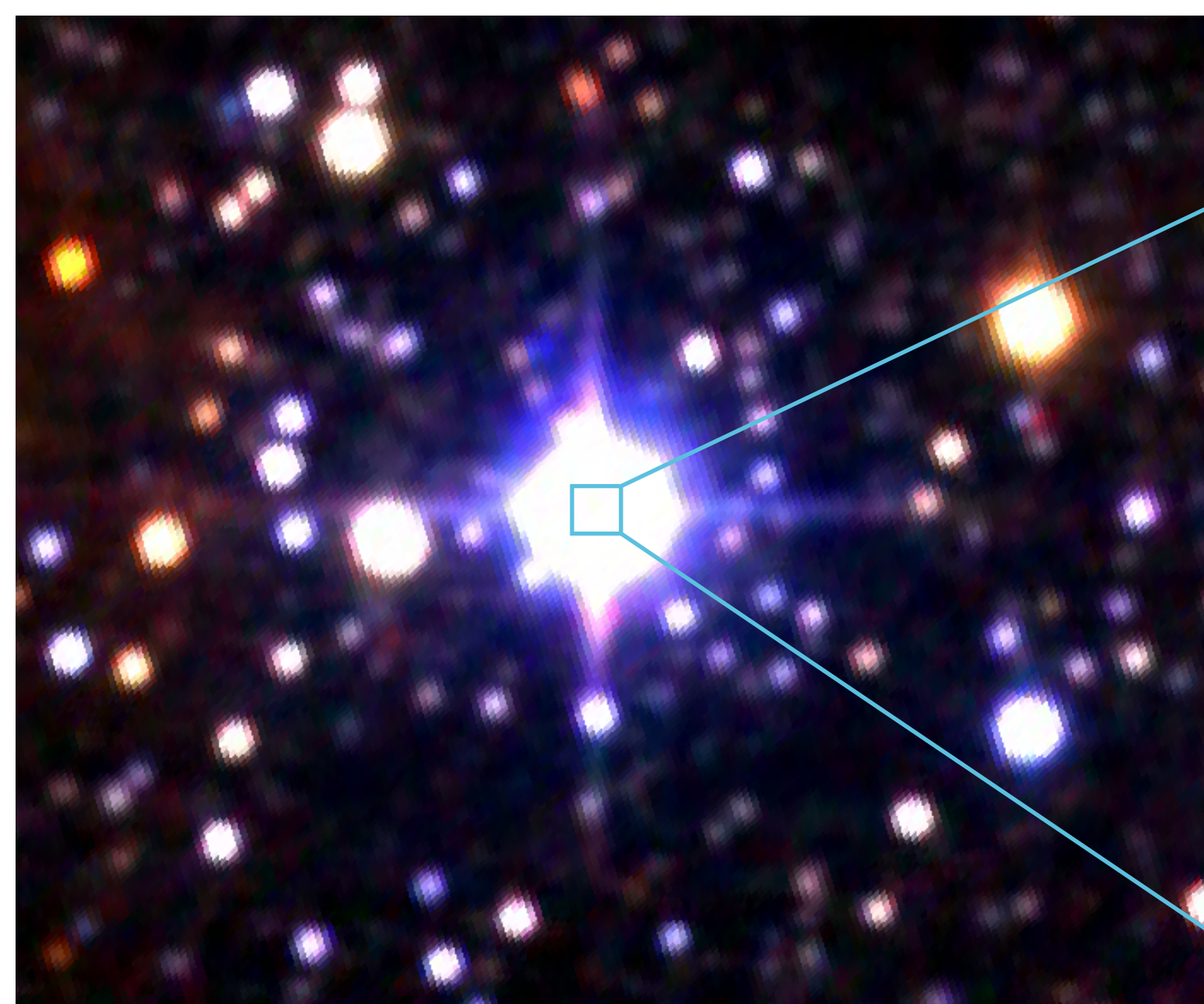
ABSTRACT

Context. Massive stars like company. However, low-mass companions have remained extremely difficult to detect at angular separations (ρ) smaller than $1''$ (approx. 1000–3000 au, considering the typical distance to nearby massive stars) given the large brightness contrast between the companion and the central star. Constraints on the low-mass end of the companions mass-function for massive stars are needed, however, for helping, for example, to distinguish among the various scenarios that describe the formation of massive stars.

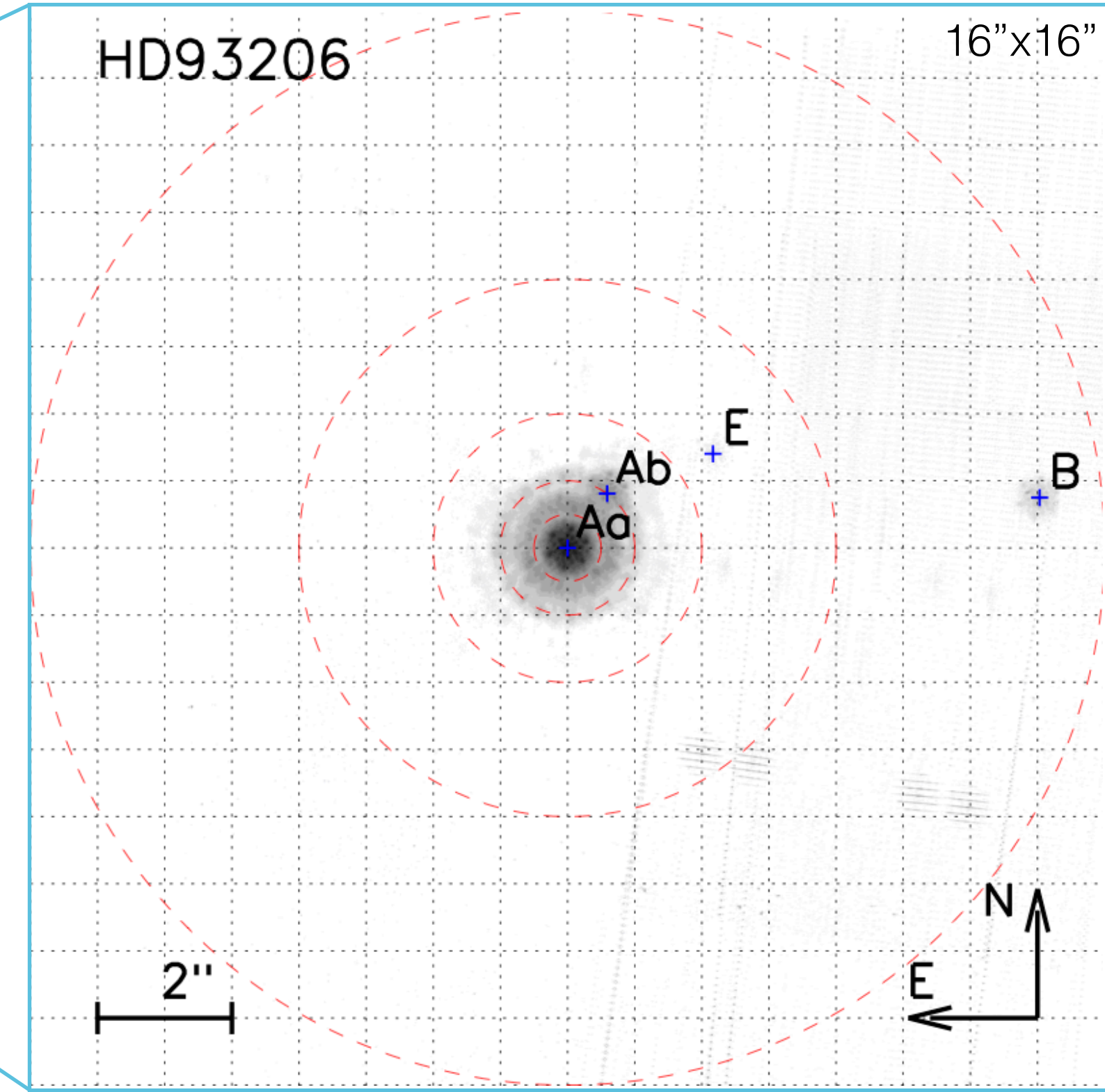
Aims. With the aim of obtaining a statistically significant constraint on the presence of low-mass companions beyond the typical detection limit of current surveys ($\Delta\text{mag} \lesssim 5$ at $\rho \lesssim 1''$), we initiated a survey of O and Wolf-Rayet stars in the Carina region using the Spectro-Polarimetric High-contrast Exoplanet REsearch (SPHERE) coronagraphic instrument on the Very Large Telescope (VLT). In this, the first paper of the series, we aim to introduce the survey, to present the methodology and to demonstrate the capability of SPHERE for massive stars using the multiple system QZ Car.



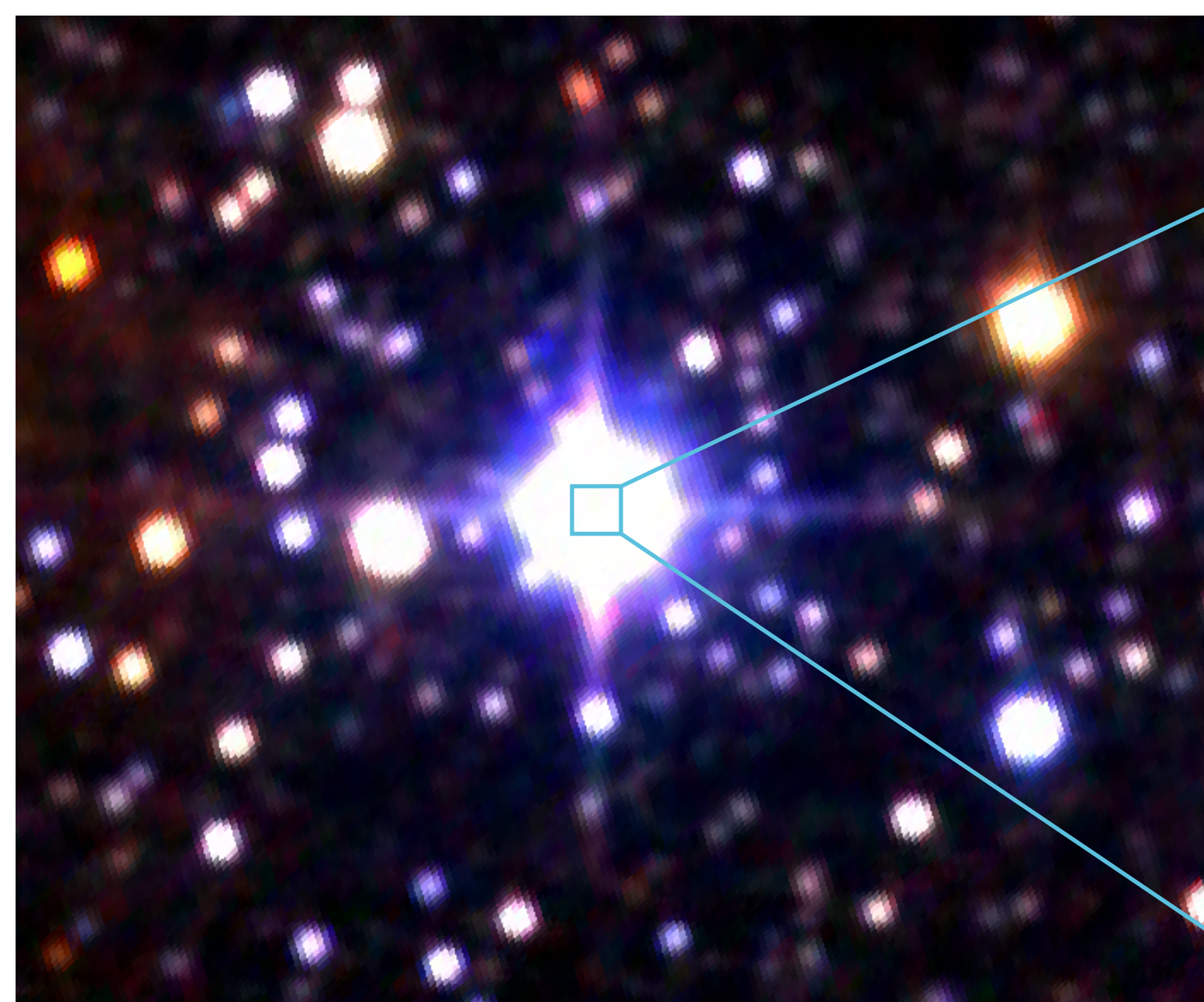
FOV = 5', 2MASS



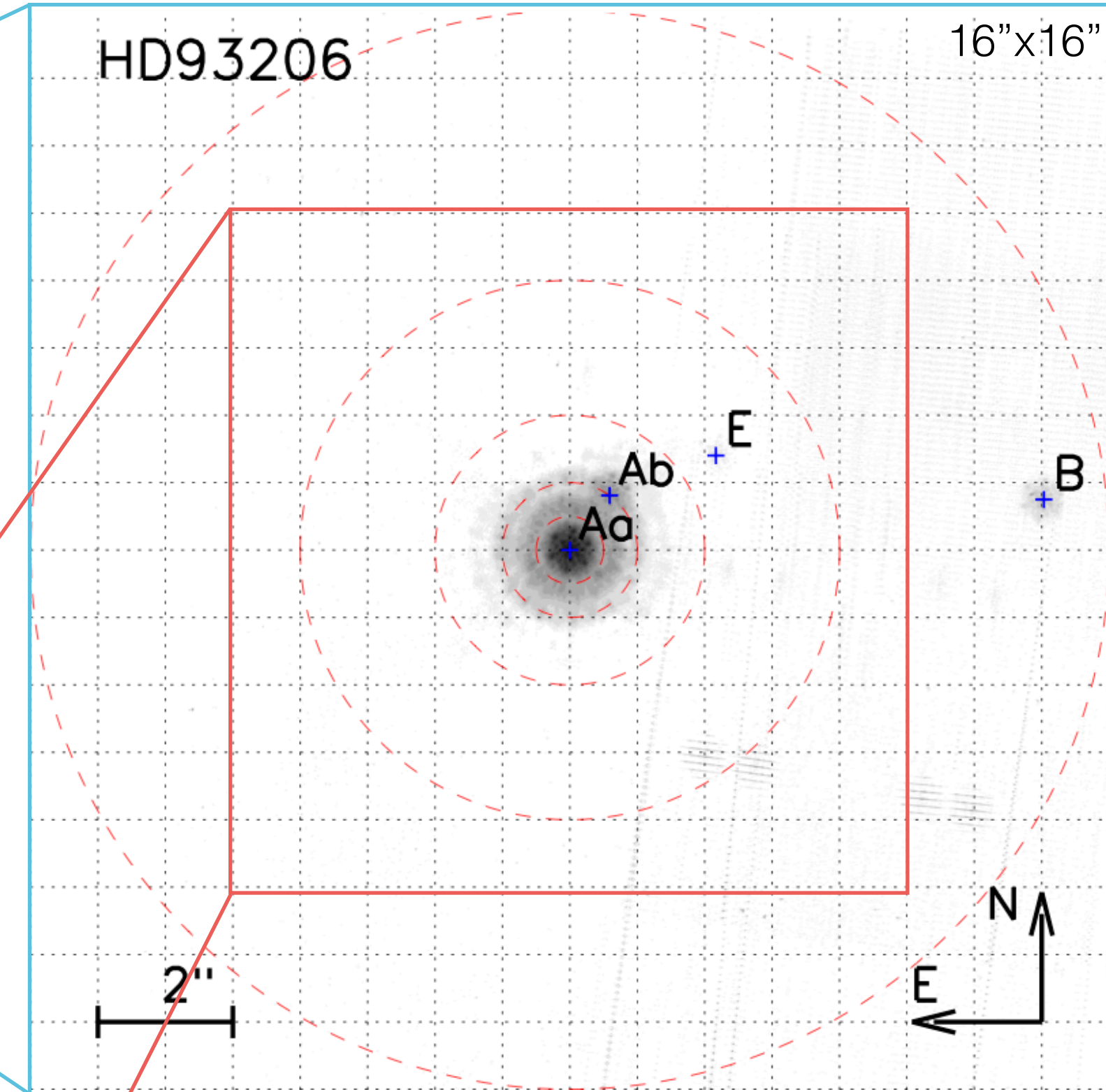
FOV = 5', 2MASS



SMA SH+ Image
Sana et al, 2014

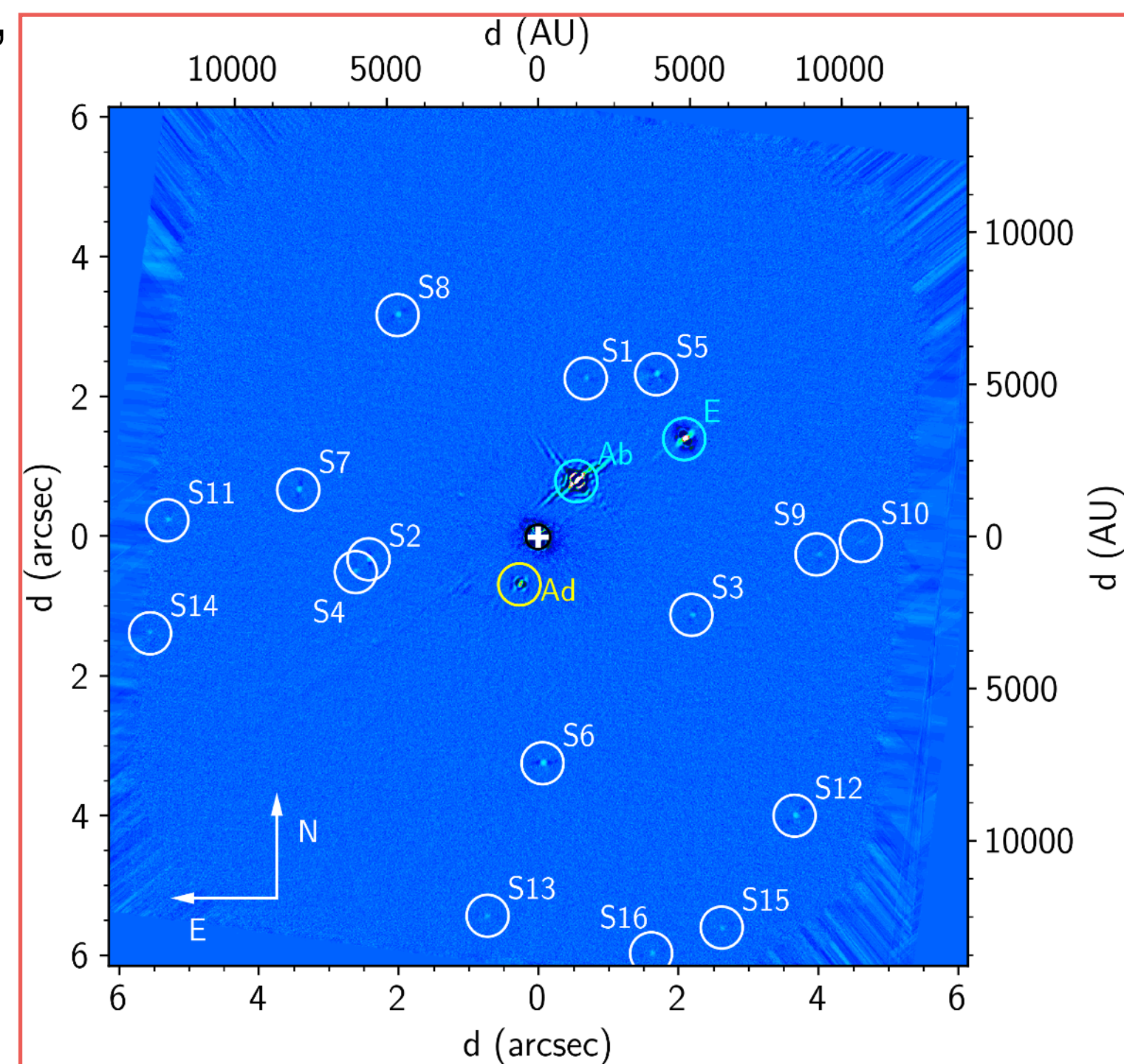


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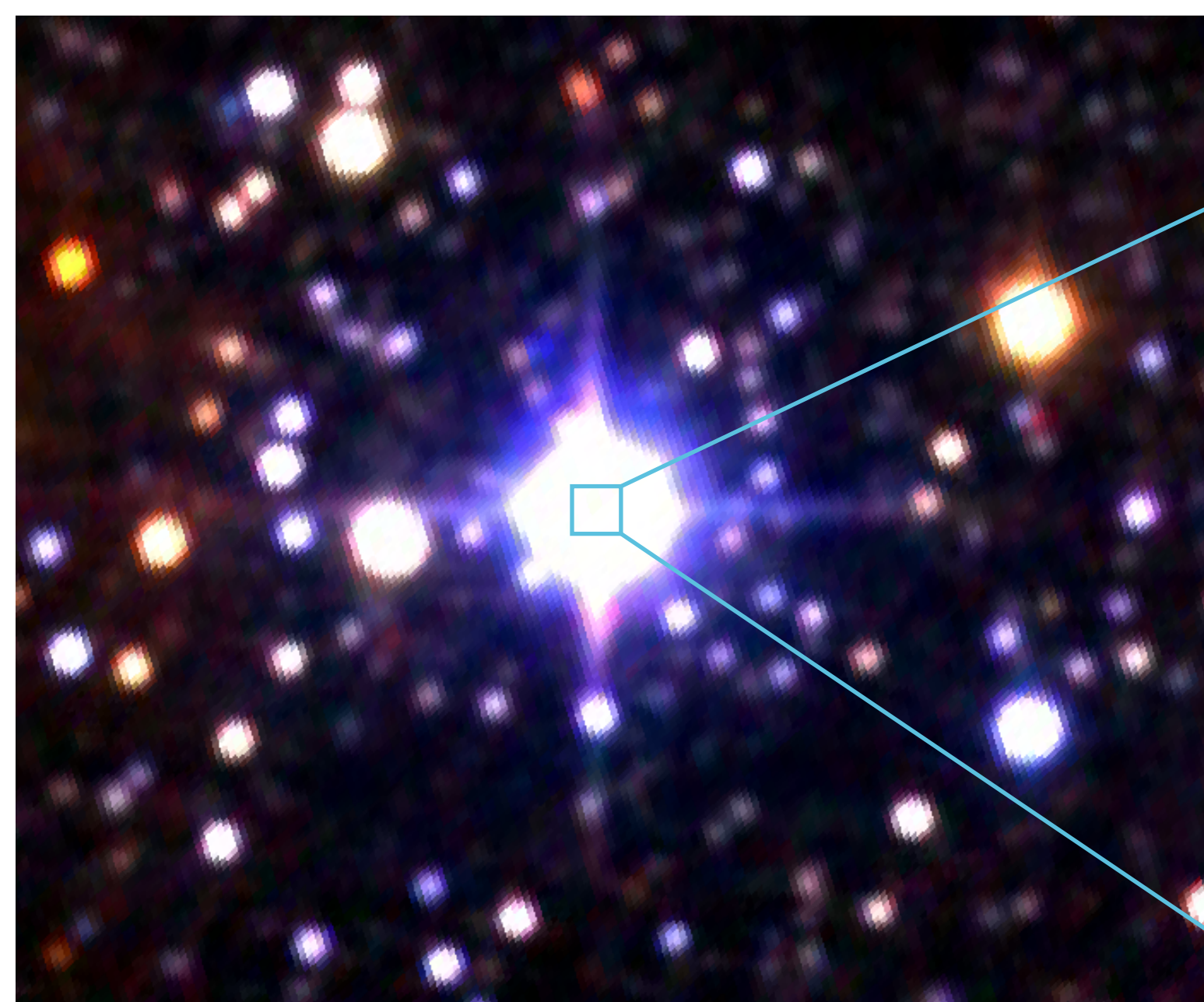


SMA SH+ Image
Sana et al, 2014

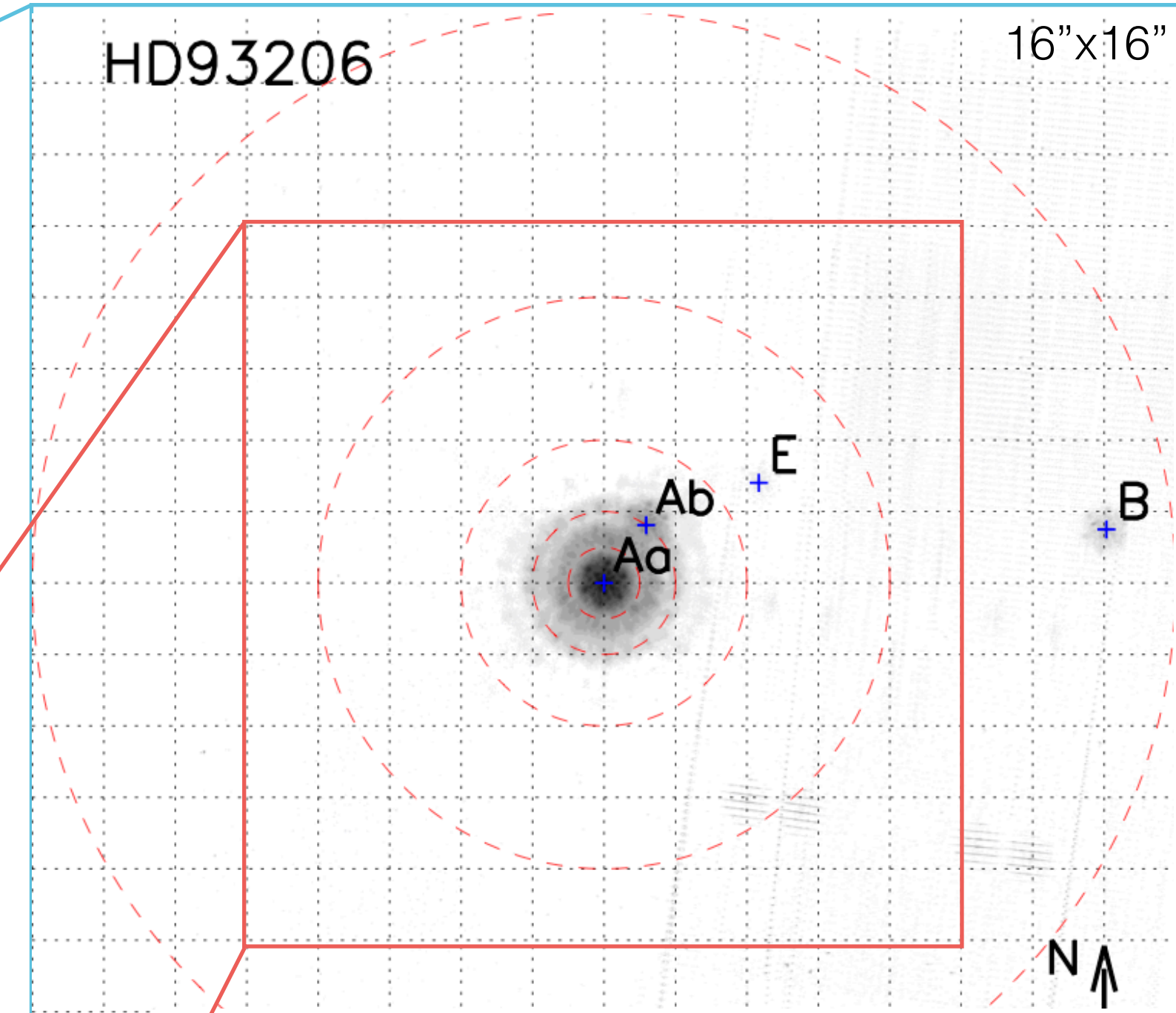
11''x11''



IRDIS



FOV = 5', 2MASS

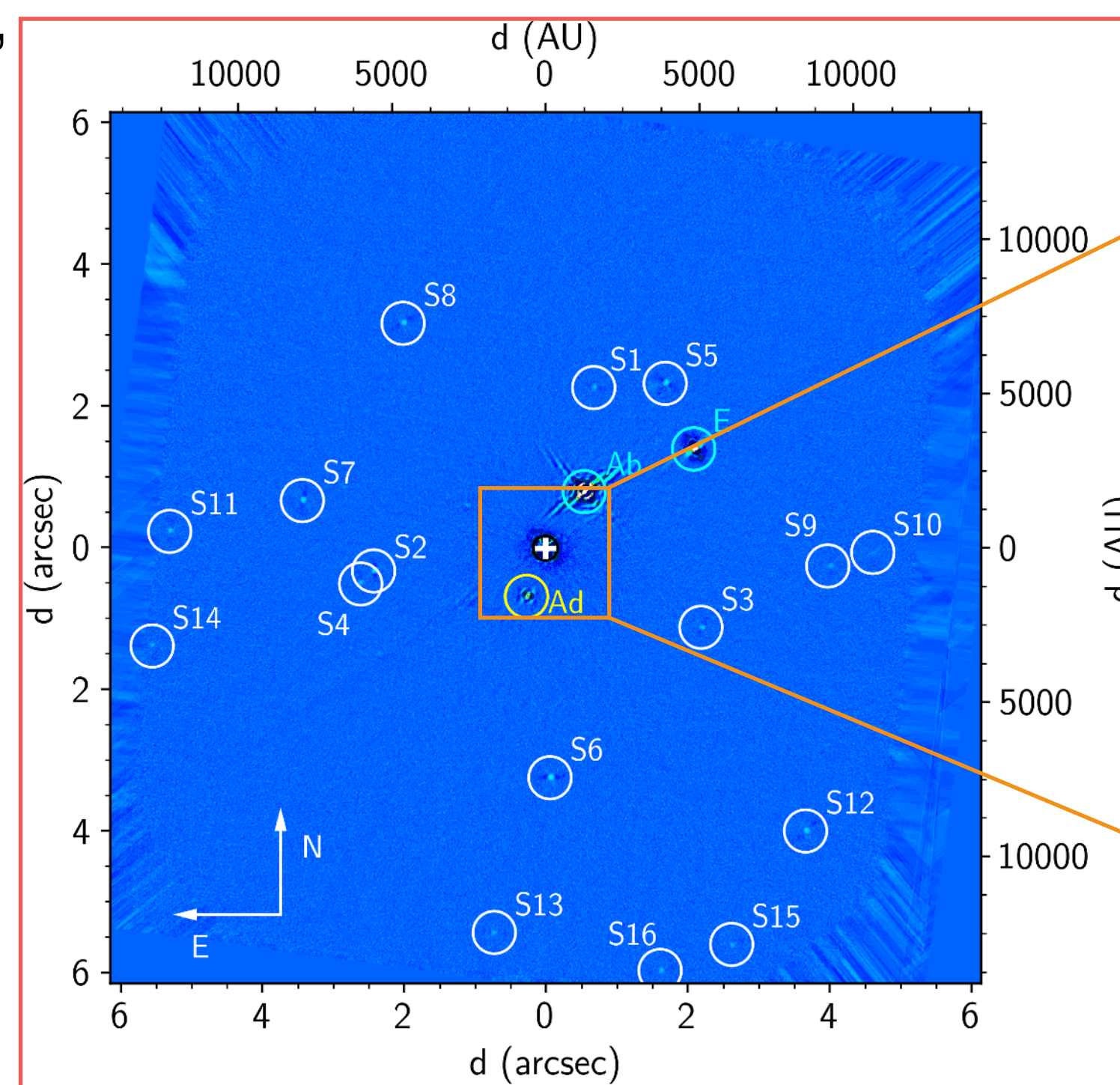


HD93206

16"x16"



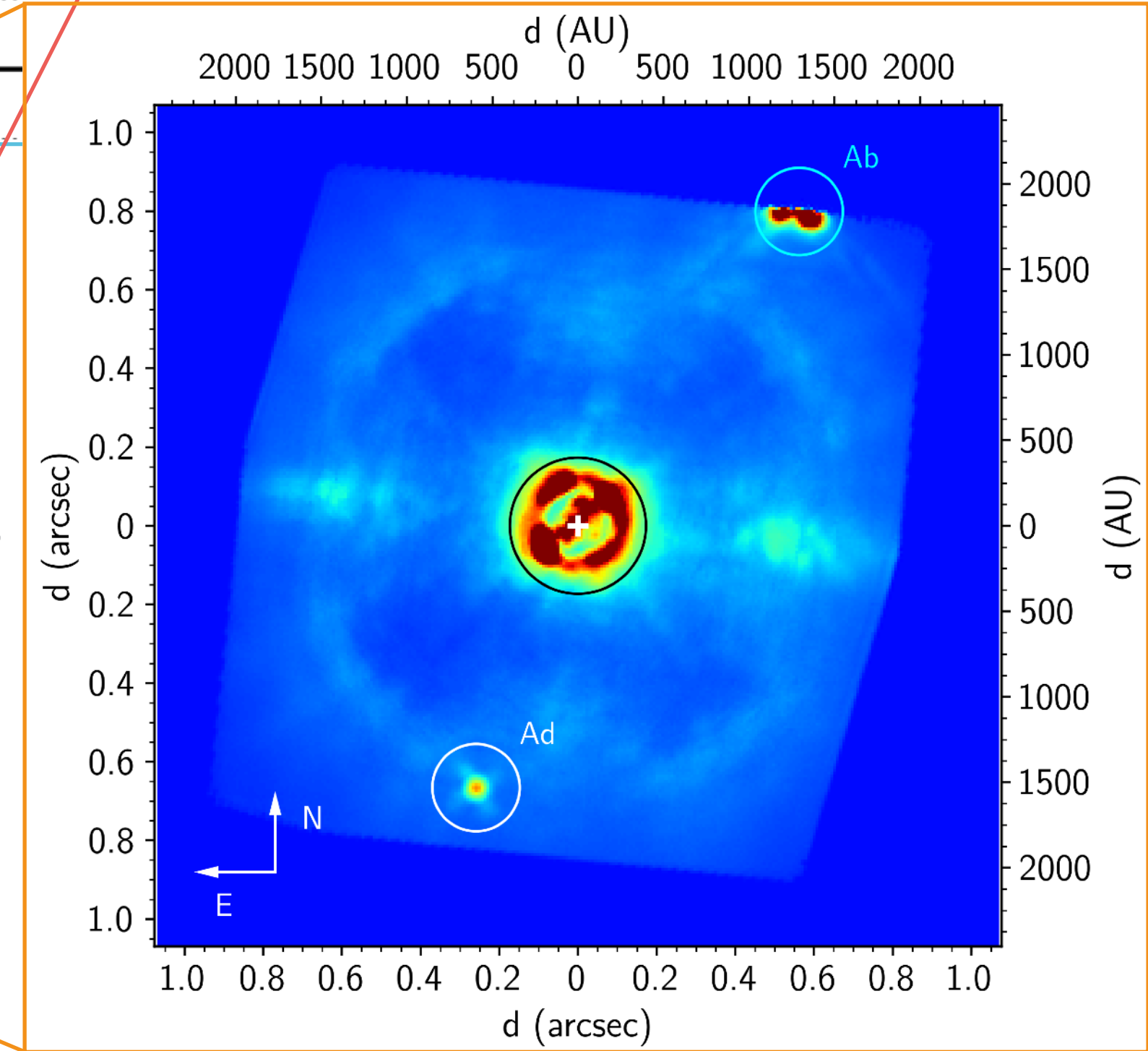
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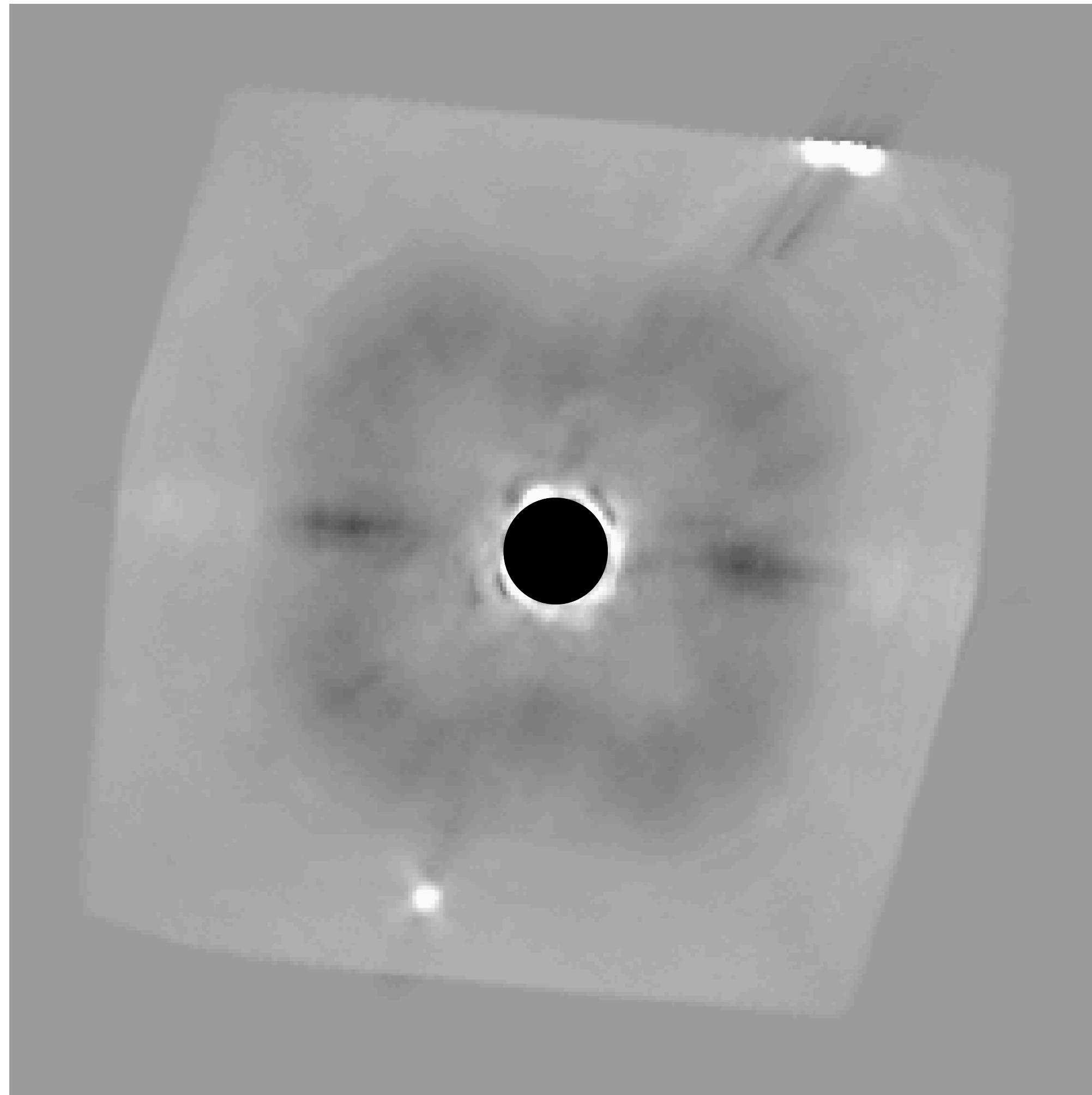
IRDIS

IFS

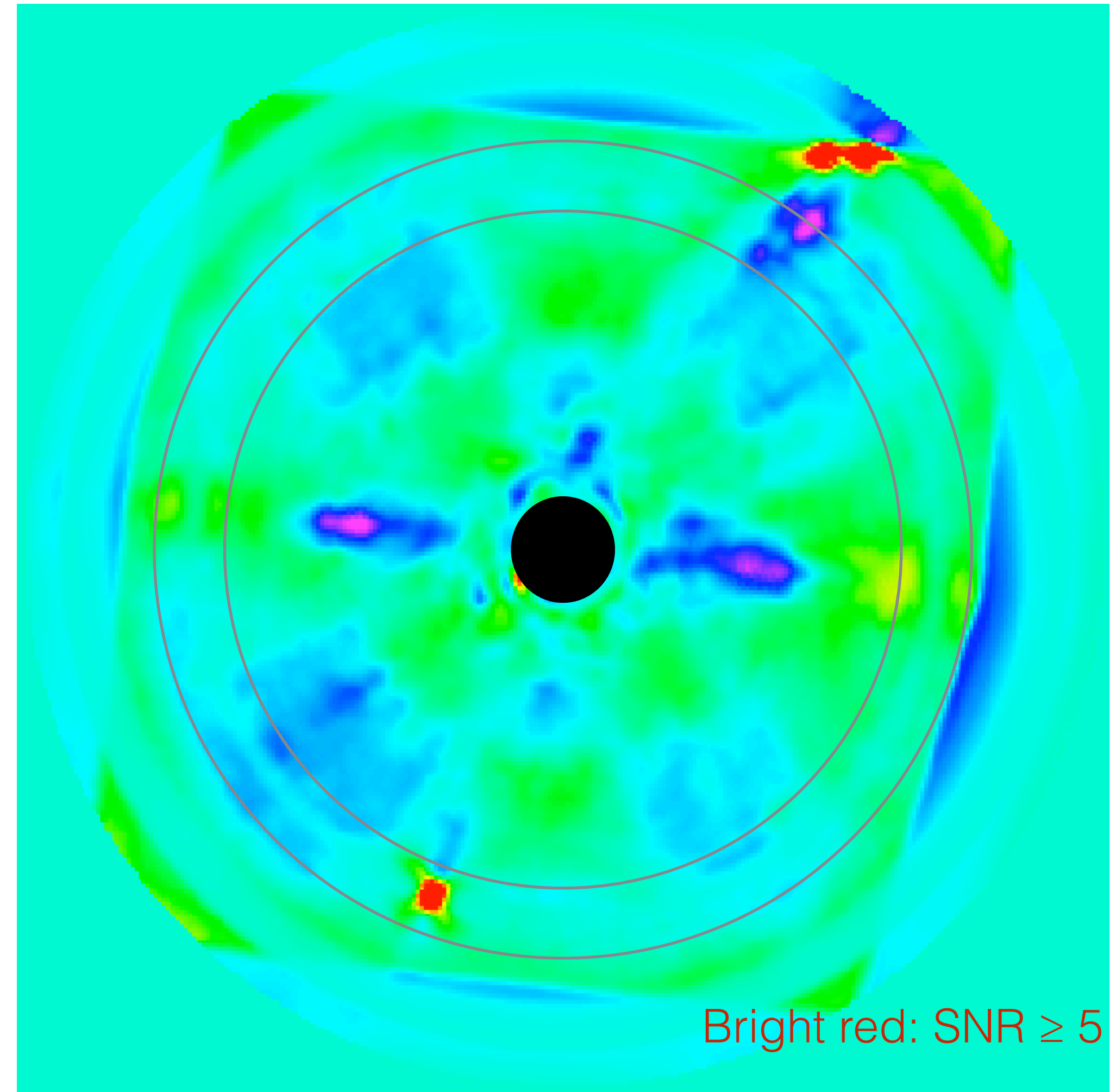
1.7"x1.7"



Detection method



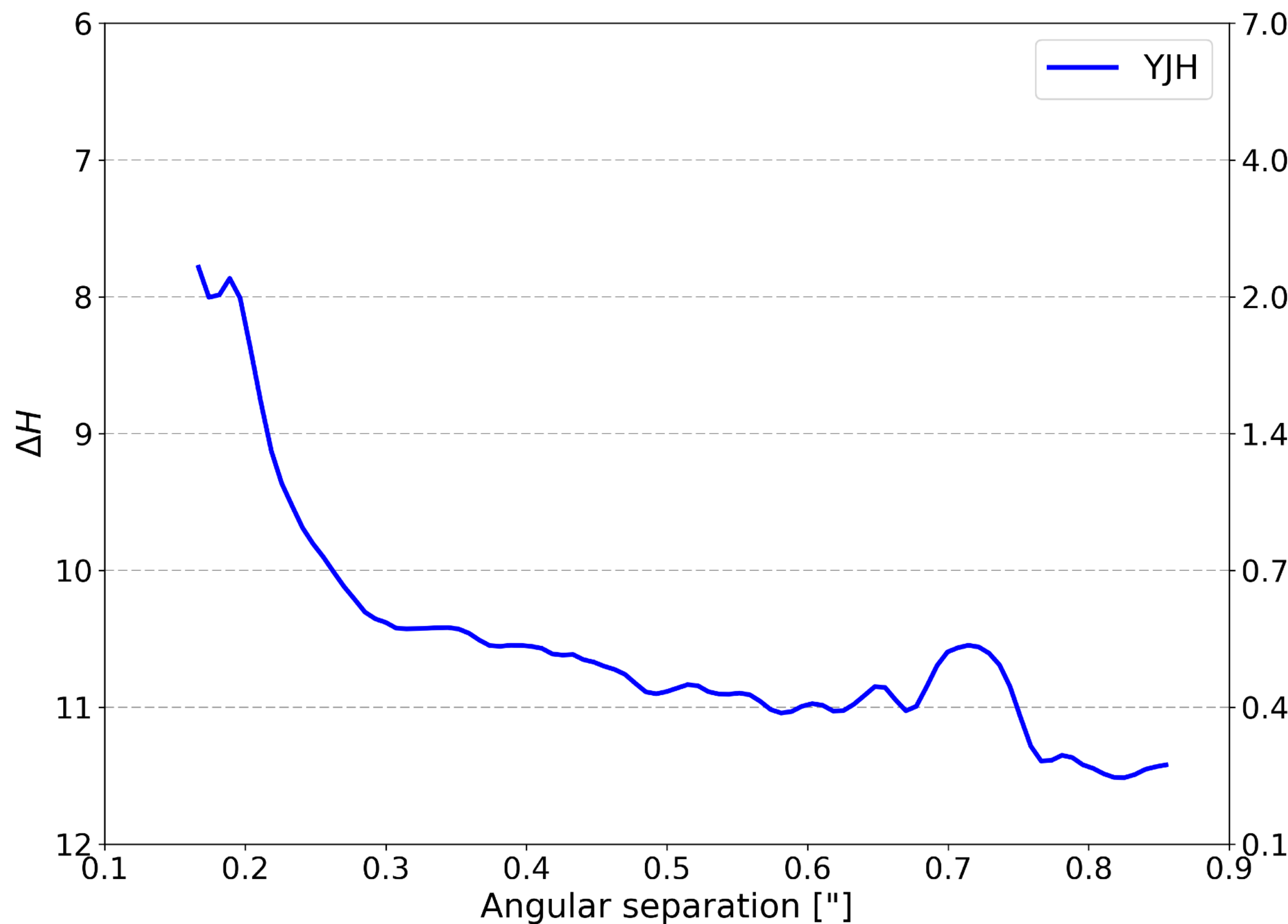
Post-processed image



Signal-to-Noise Ratio map

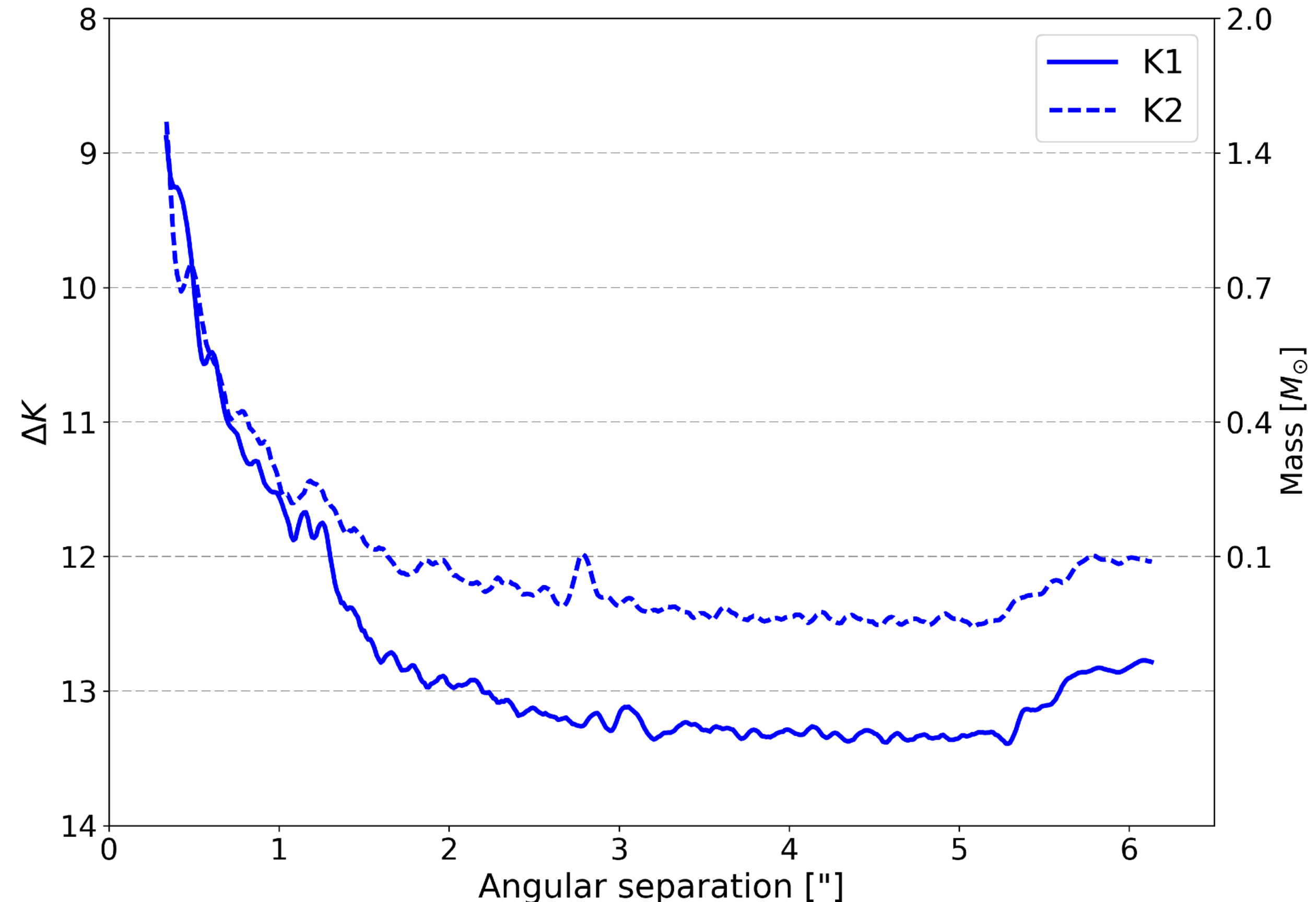
Bright red: $\text{SNR} \geq 5$

Detection limits



IFS

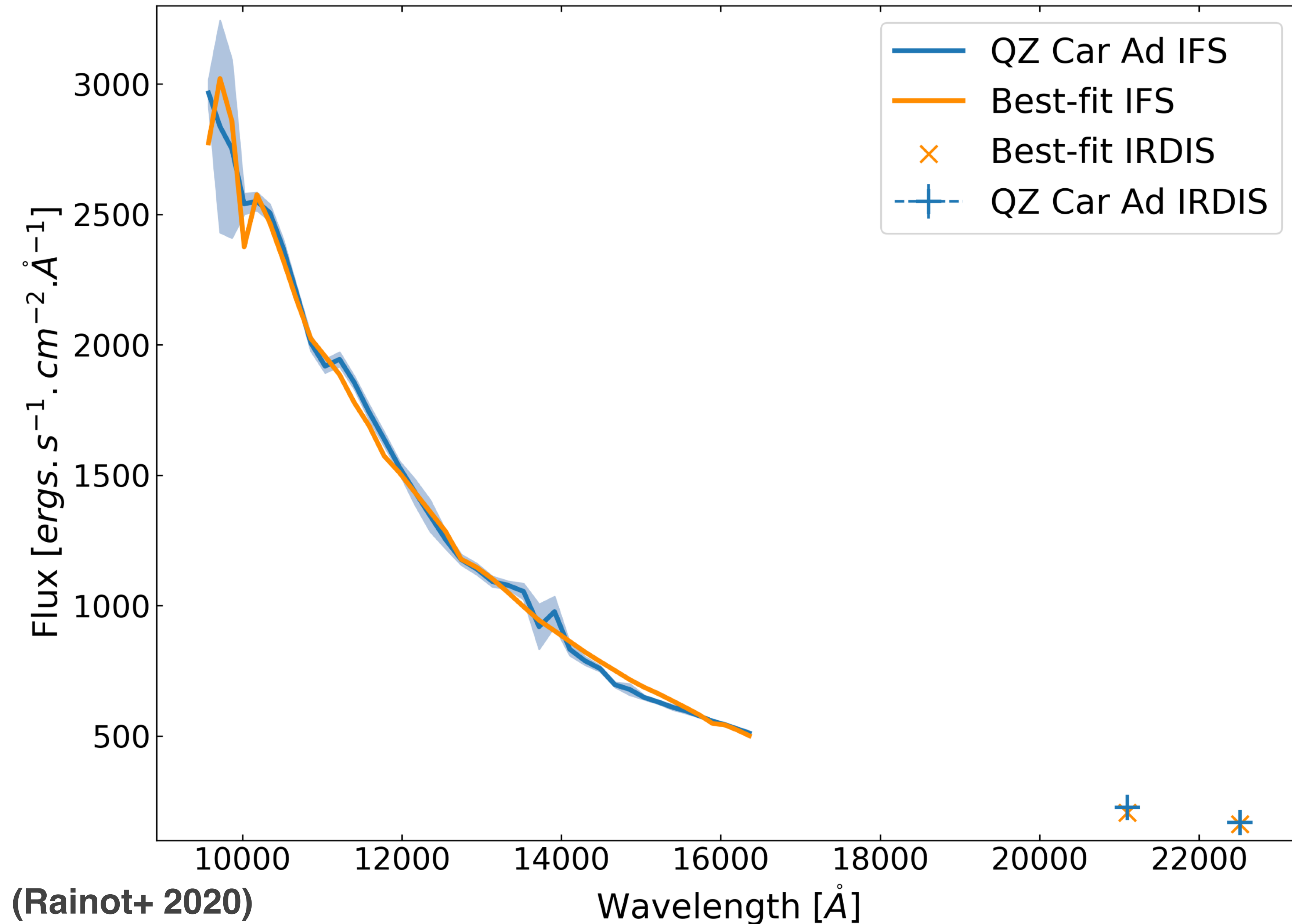
(Rainot+ 2020)



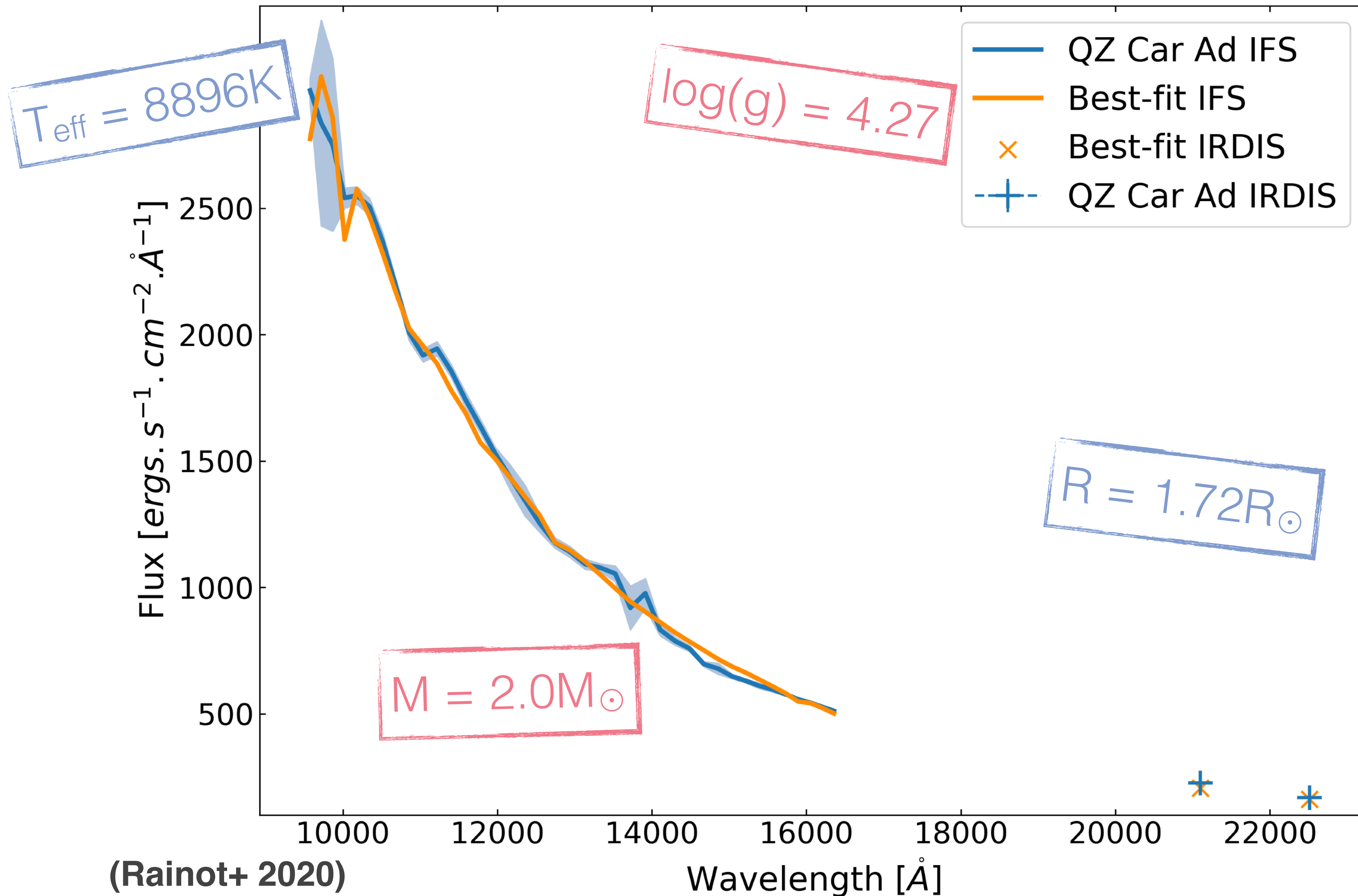
IRDIS

Stellar characterisation

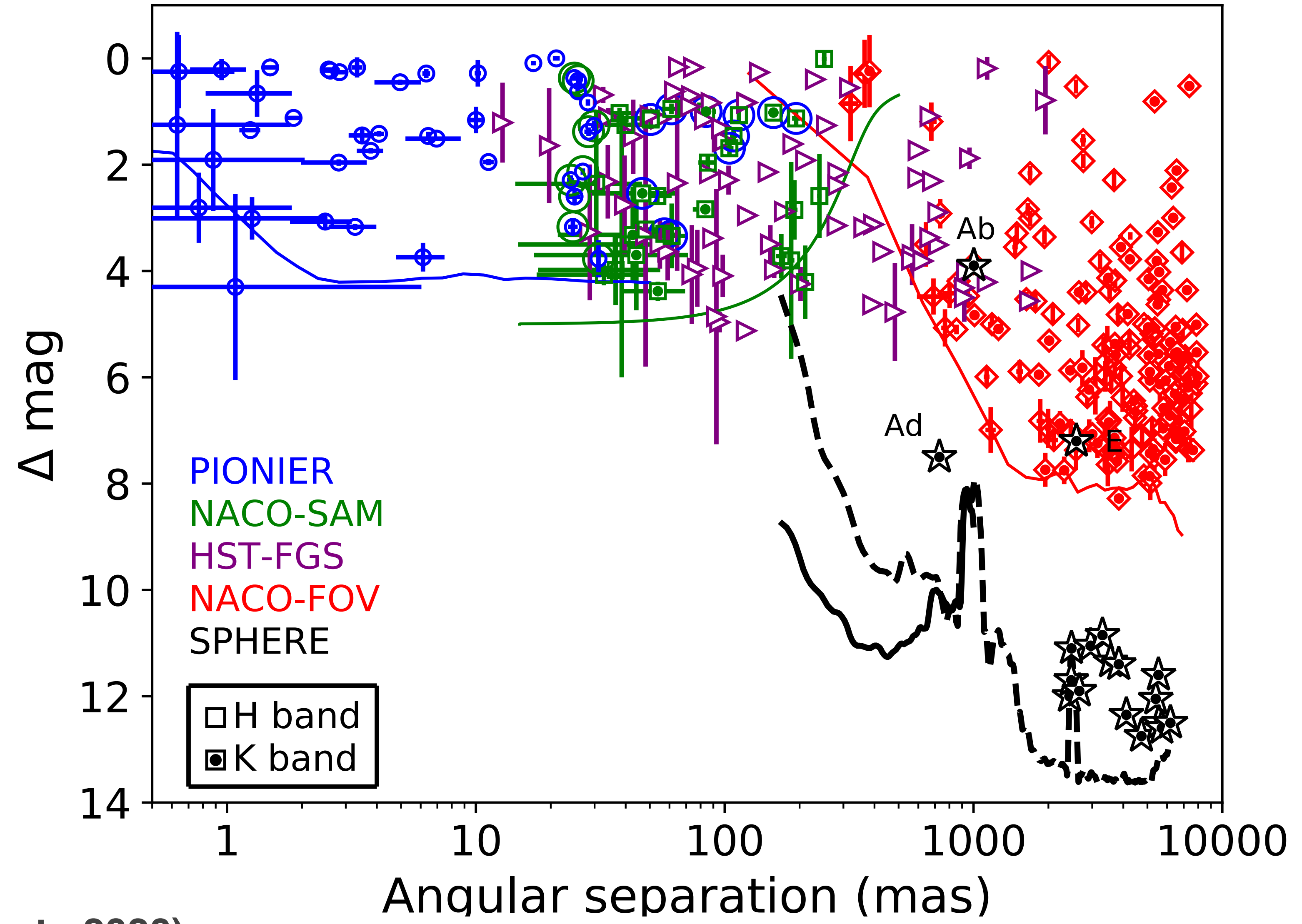
IFS - QZ Car Ad



IFS - QZ Car Ad



SMaSH+ (Sana+, 2014) & HST-FGS (Aldoretta+, 2015)



(Rainot+ 2020)

Carina High-contrast Imaging Project for massive Stars (CHIPS)

II. A study of the close Trumpler 14 cluster

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⁸ Departamento de Física Teórica e Experimental, Universidade Federal do Rio Grande do Norte, CP 1641, Natal, RN, 59072-970, Brazil

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¹¹ LESIA, (UMR 8109), Observatoire de Paris, PSL, CNRS, UPMC, Université Paris-Diderot, 5 place Jules Janssen, 92195 Meudon, France

¹² Space Telescope Science Institute, 3700 San Martin Drive, Baltimore, MD, 21218, USA

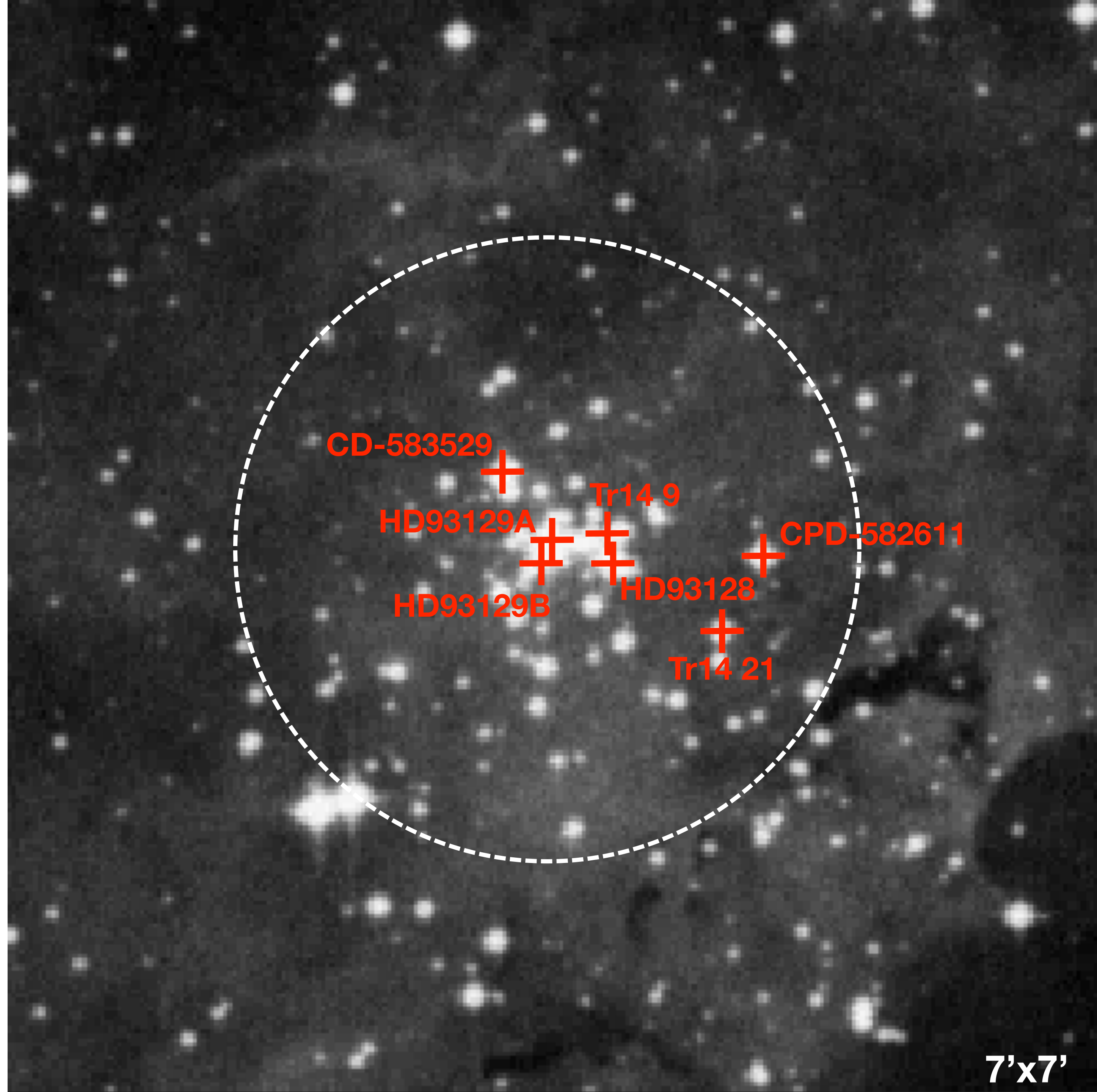
¹³ Universidad Autonoma de Chile, Avda Pedro de Valdivia 425, Providencia, Santiago de Chile, Chile

November 25, 2020

ABSTRACT

Context. Being single is not the way of massive stars. Understanding the formation of massive stars is a key issue in astrophysics today and to help constrain the different formation scenarios that exist, obtaining insights on the low-mass end of the companion mass-function of such stars is crucial. Unfortunately, this is a challenging endeavour as low-mass companions at angular separations (ρ) below 1'' (approx. 1000–3000 au) have been difficult to detect due to their brightness contrast with the central star.

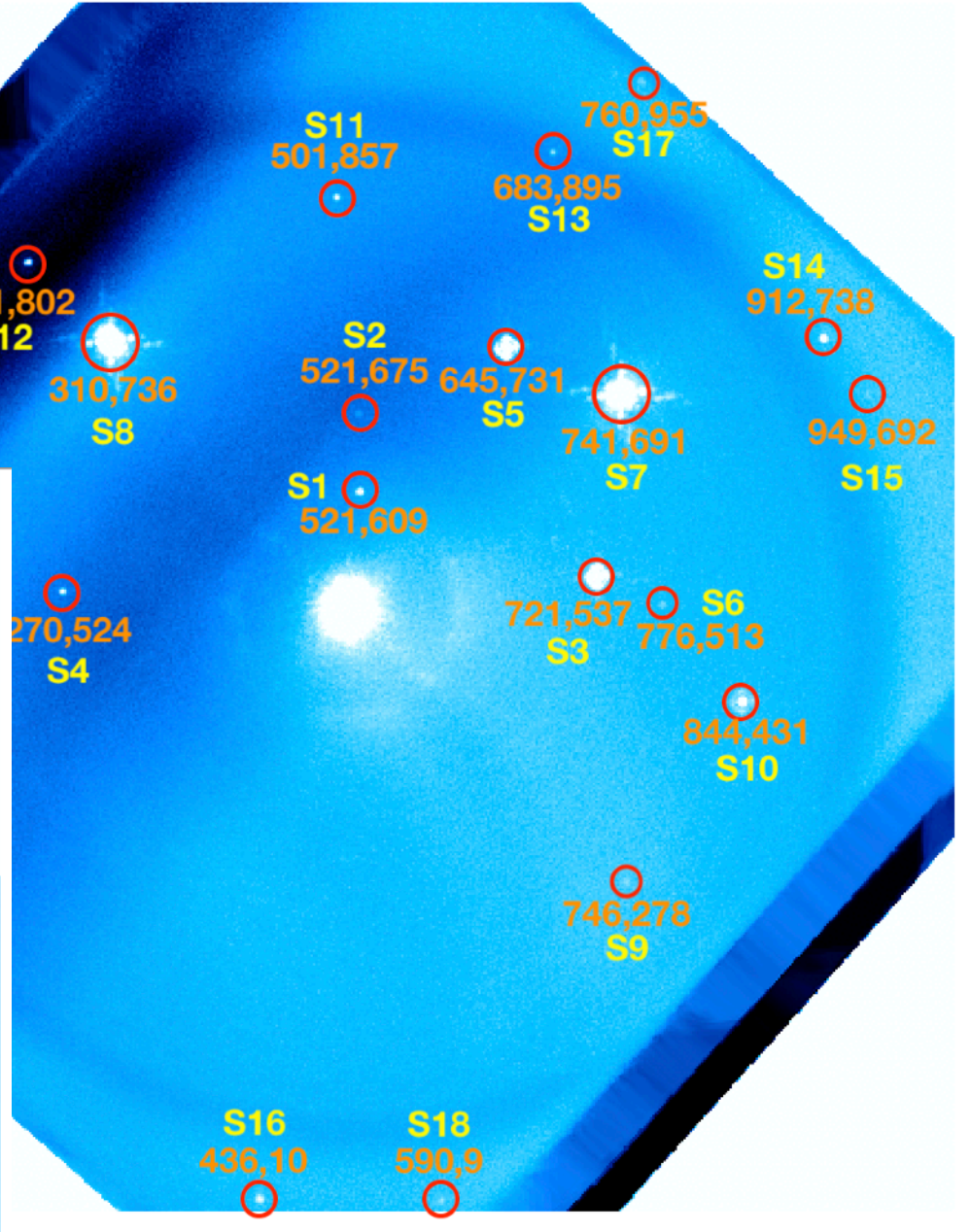
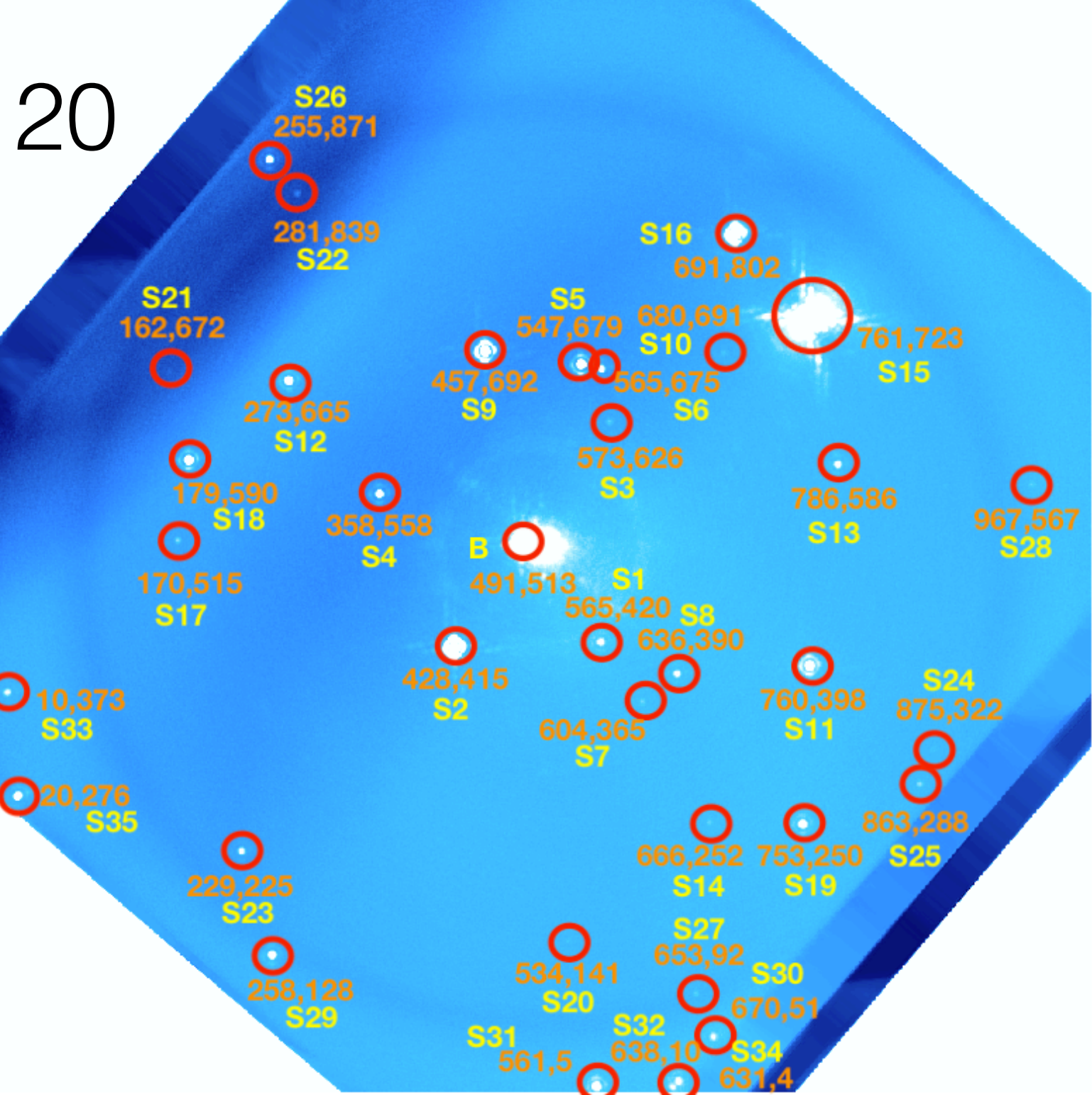
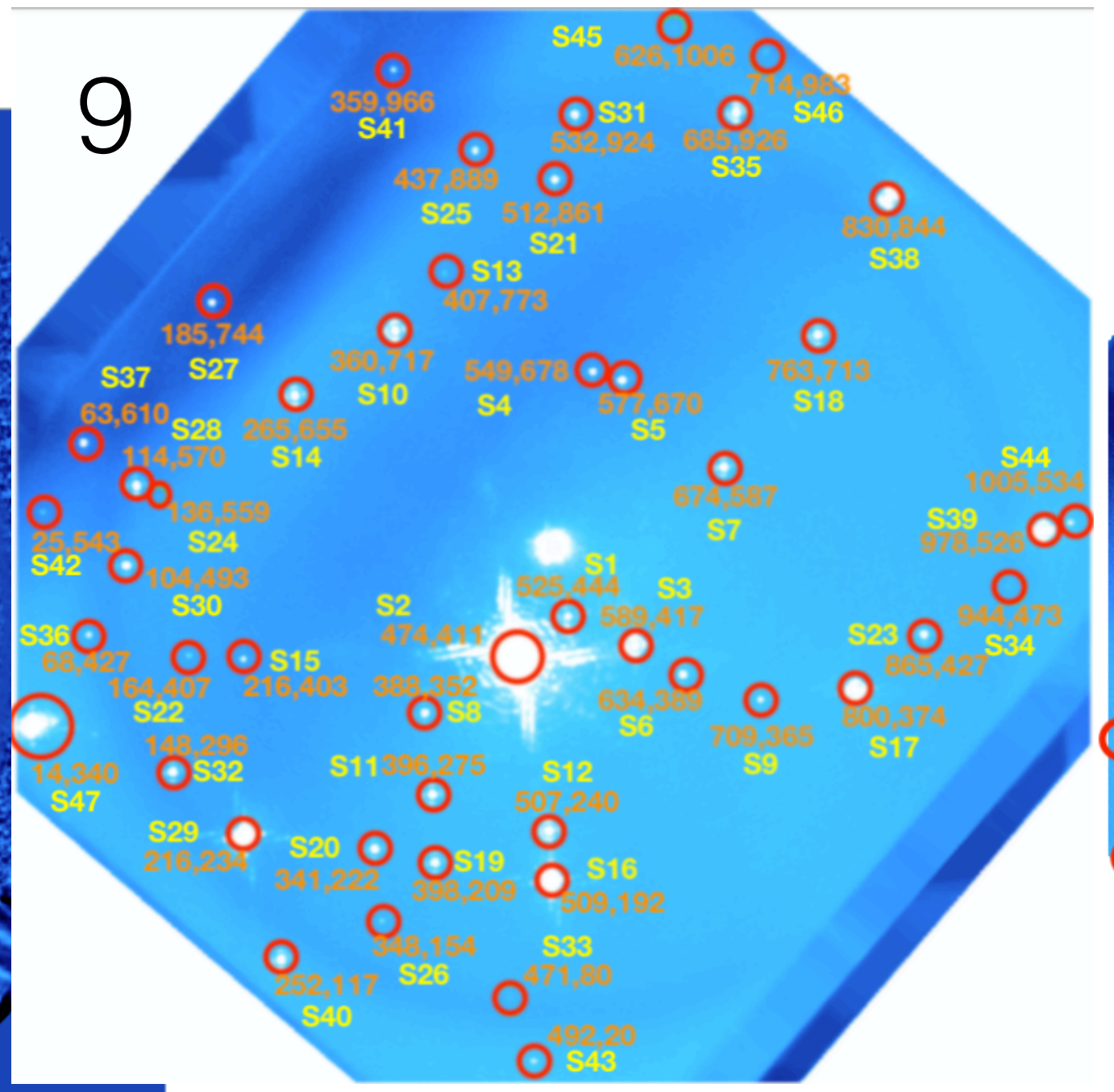
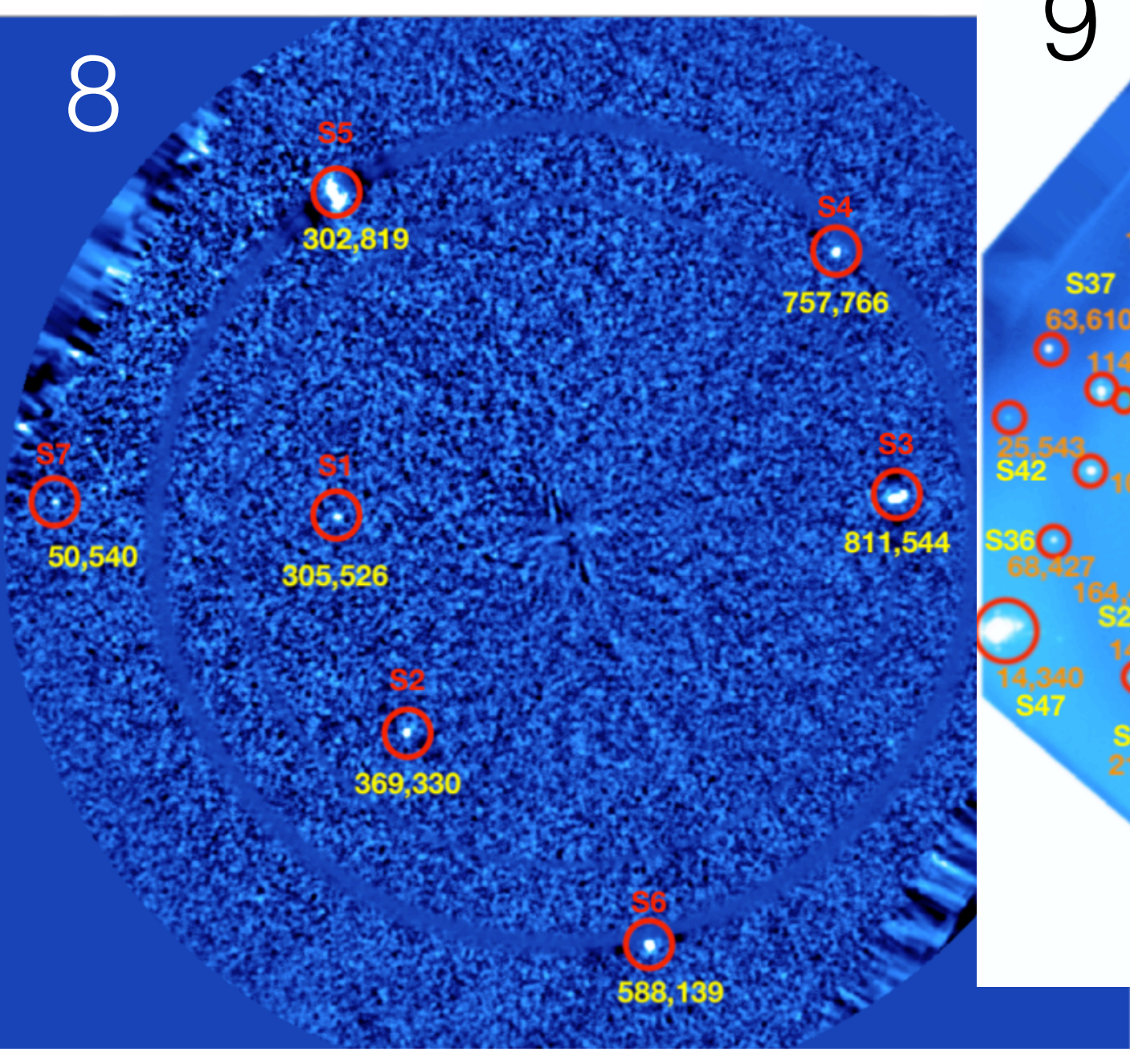
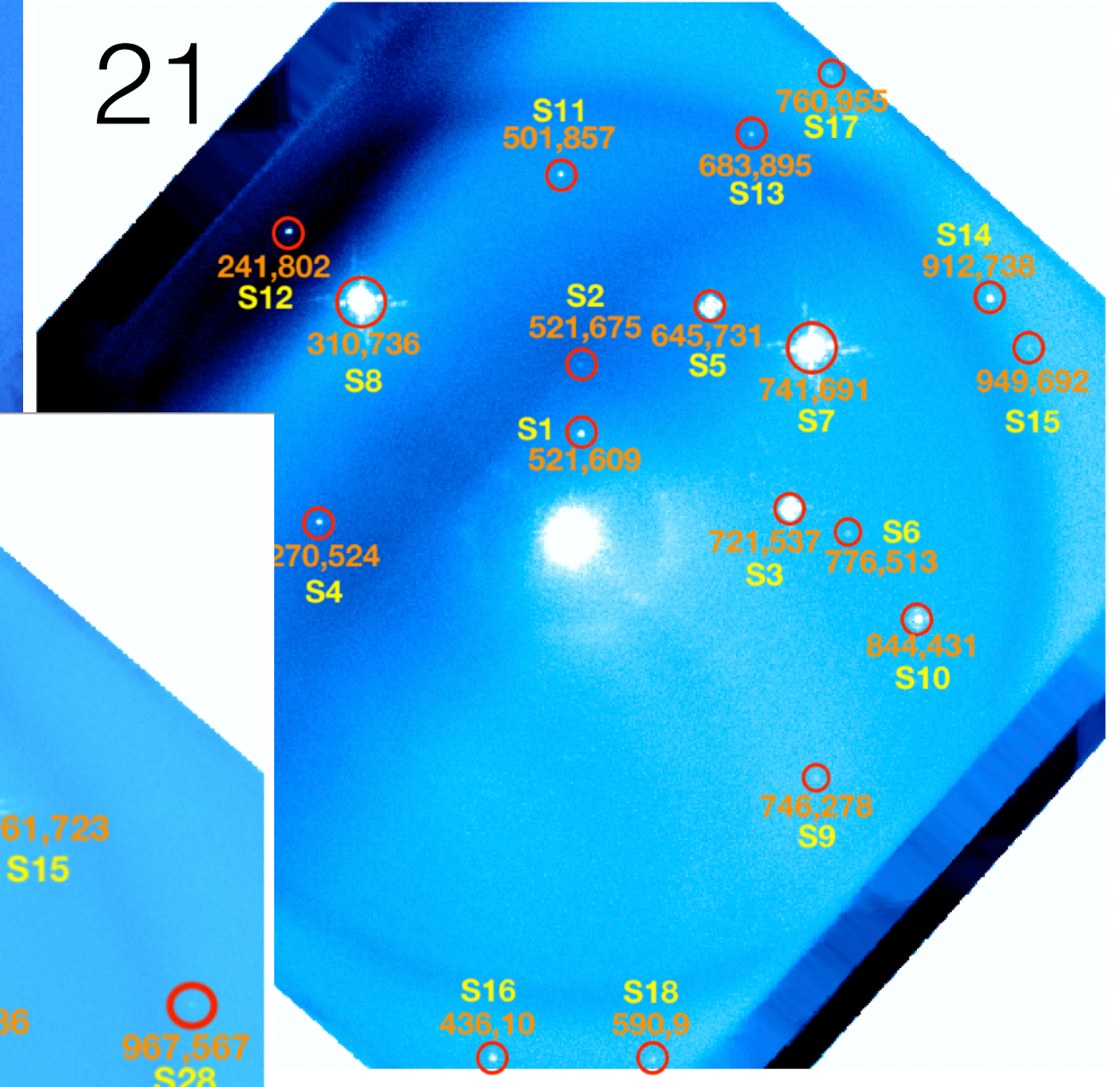
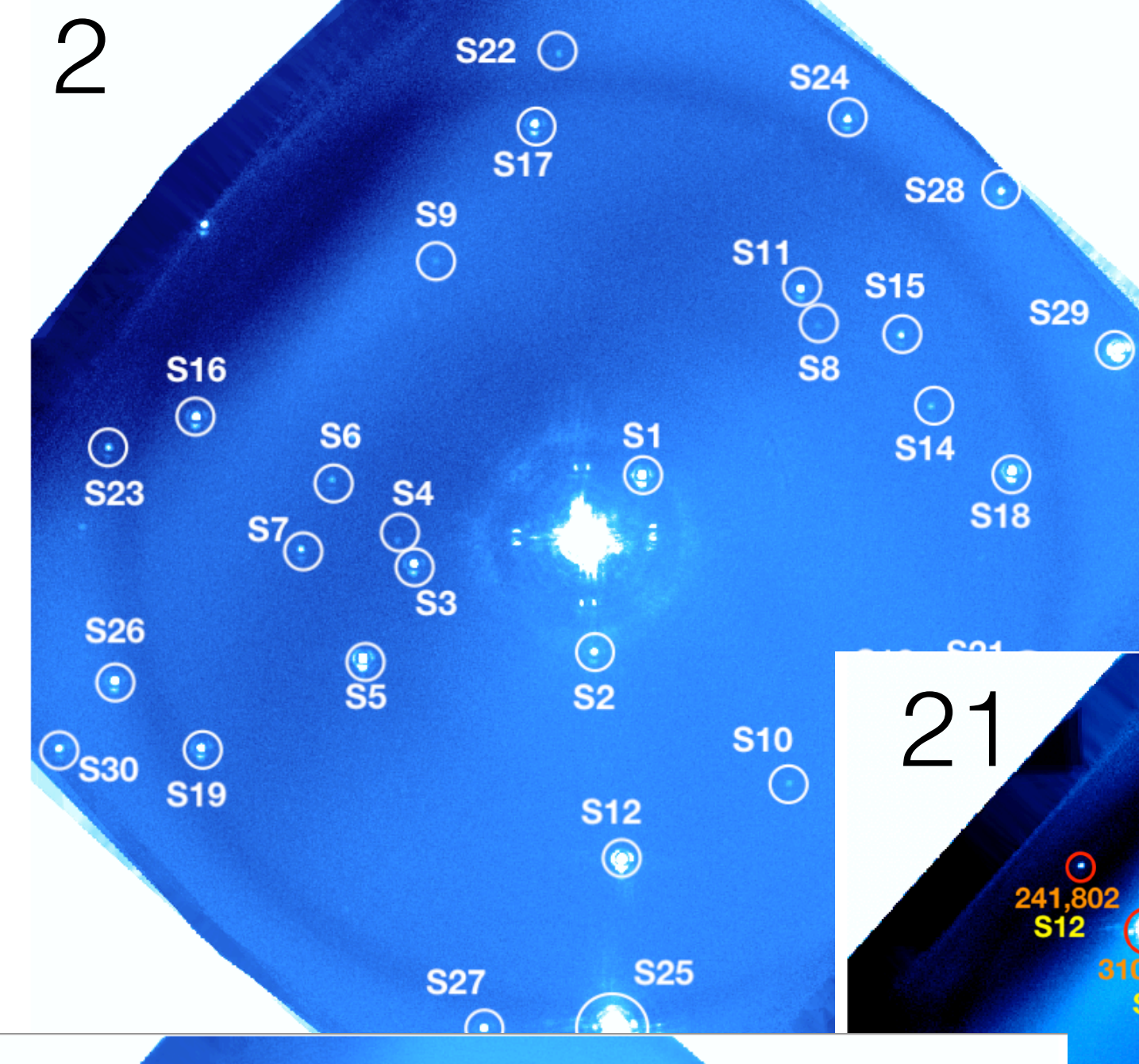
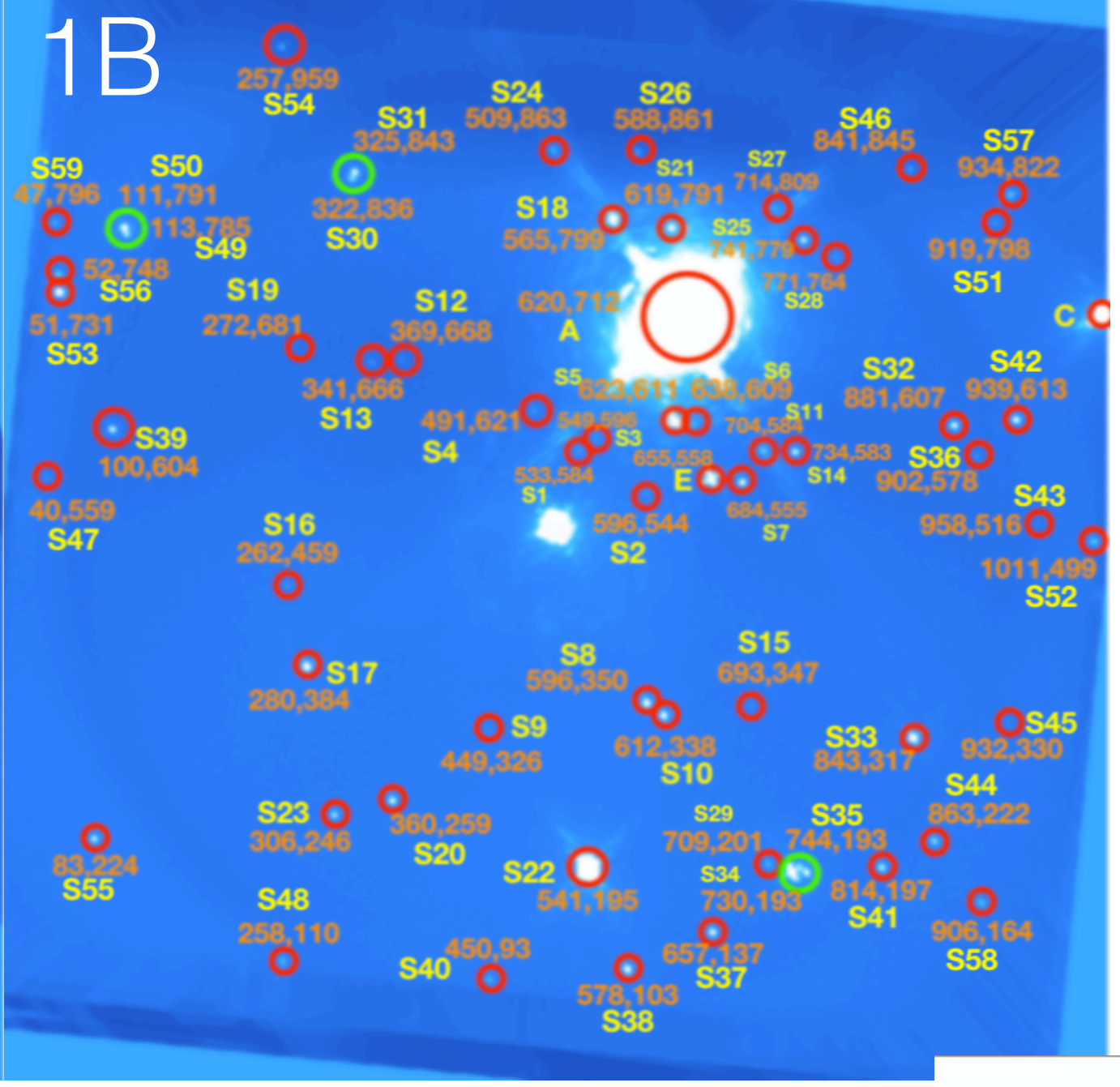
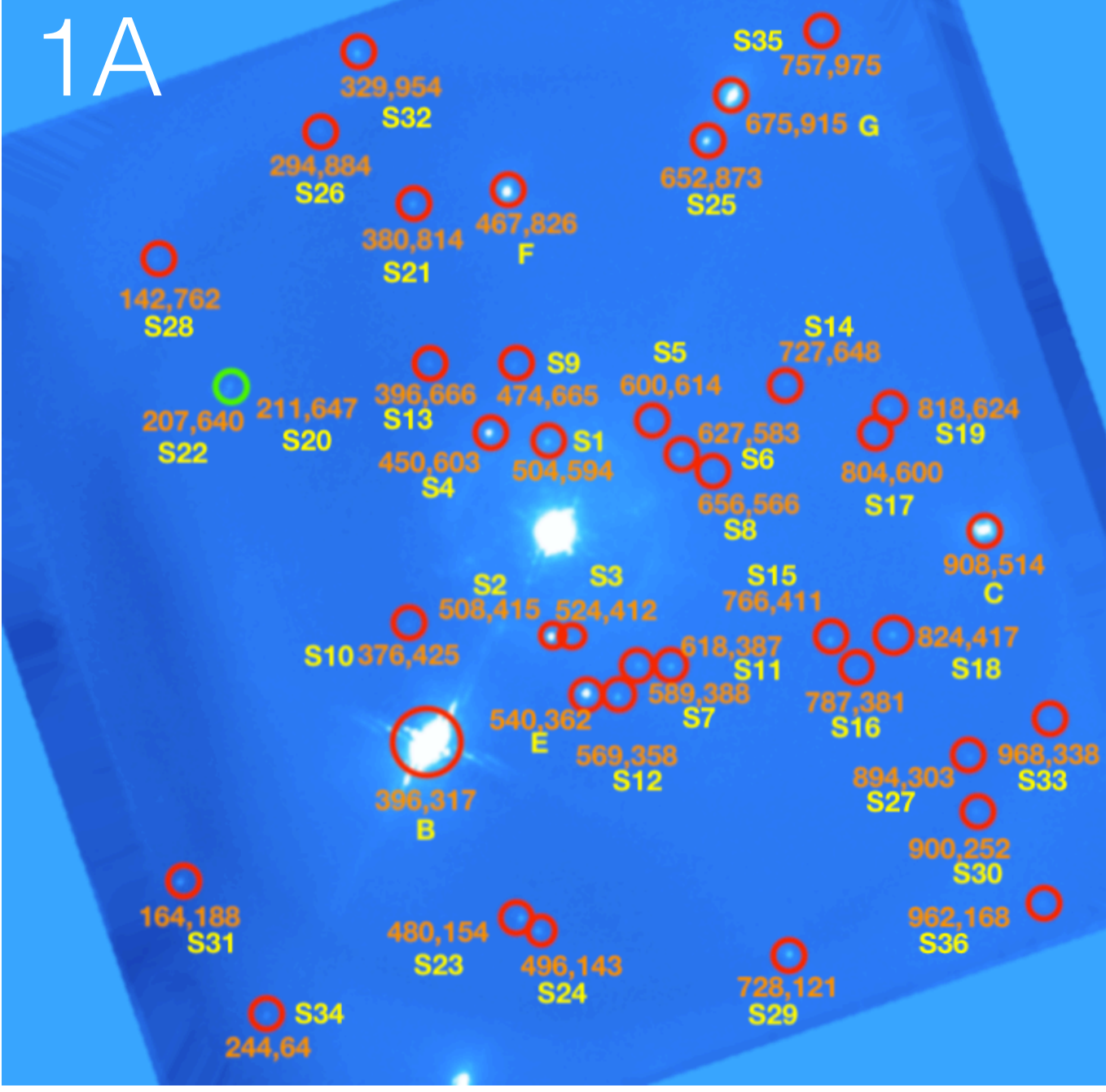
Aims. With the Carina High-contrast Imaging Project of massive Stars (CHIPS), we aim to obtain statistically significant constraints on the presence of low-mass companions around massive stars at a previously unreachable observable window ($\Delta mag \lesssim 10$ at $\rho \lesssim 1''$) for the 92 O and Wolf-Rayet stars known in the Carina region using the Spectro-Polarimetric High-contrast Exoplanet REsearch (SPHERE) coronagraphic instrument on the Very Large Telescope (VLT). In the first paper of this series, we introduced the survey and presented the methodology as well as some first results with the star OZ Car. As the second paper in the series, here we aim to



(Rainot+ in prep.)

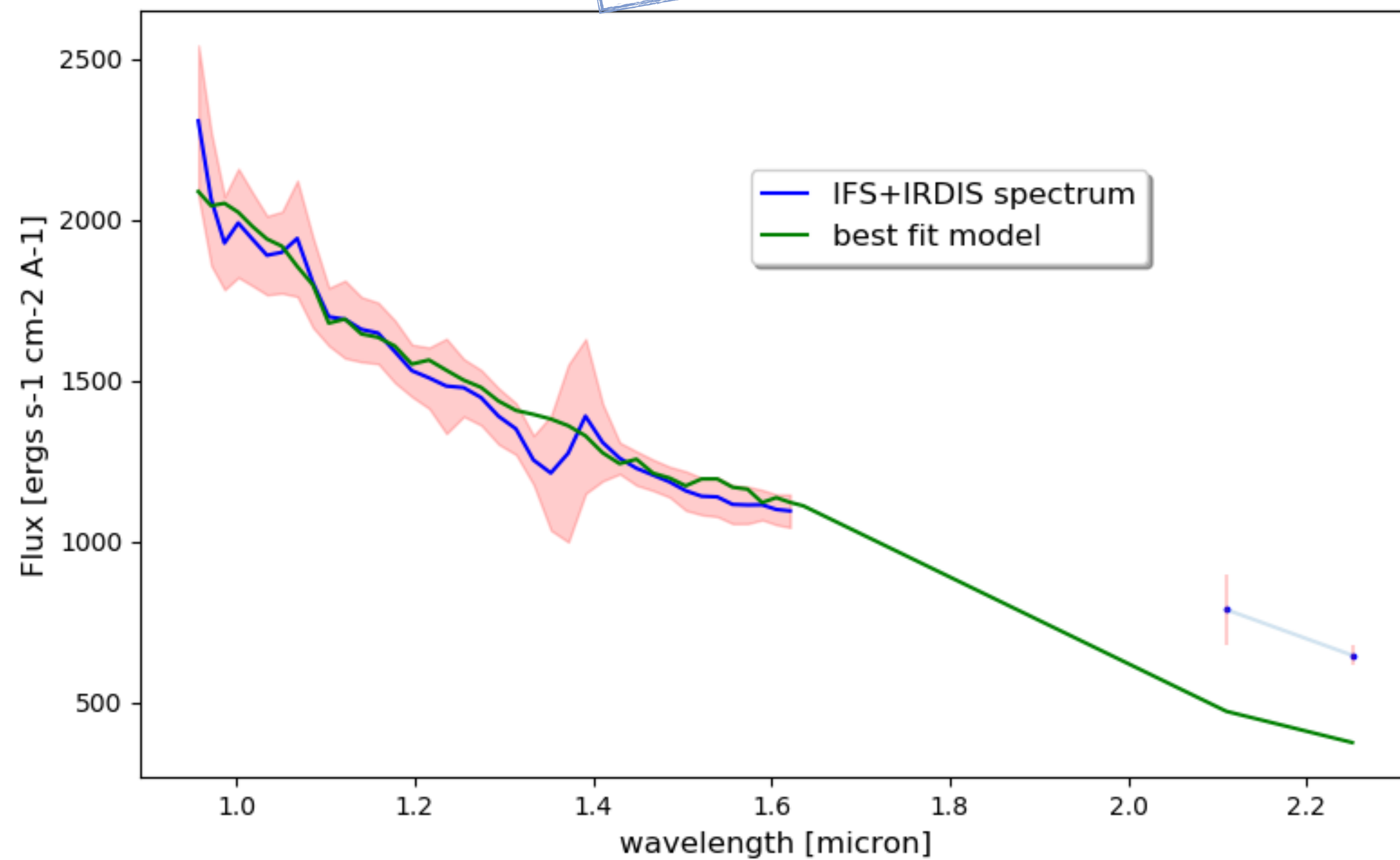
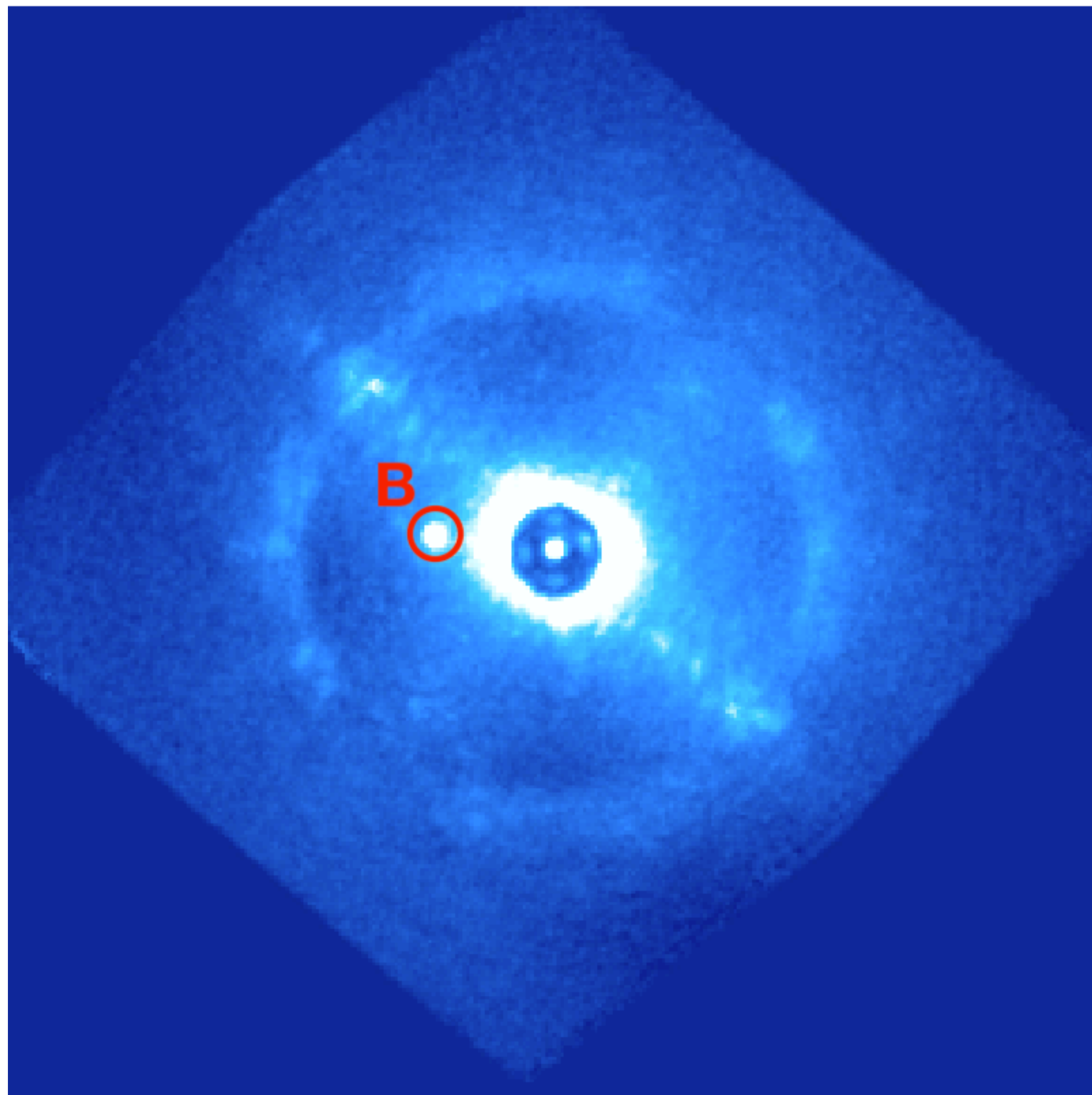
7'x7'

DSS2



CD-583529

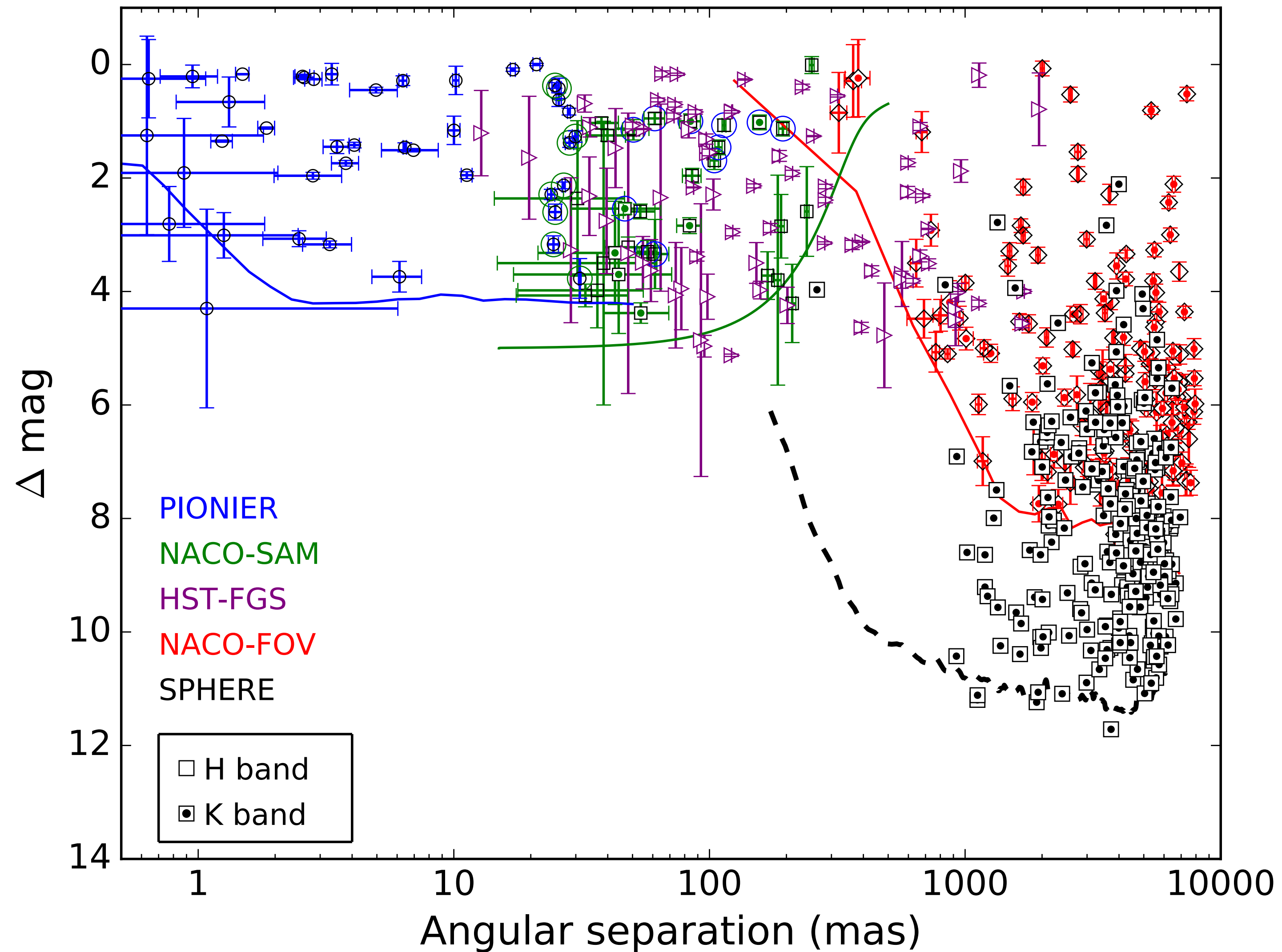
$T_{\text{eff}} = 4408\text{K}$



$M = 1.3M_{\odot}$

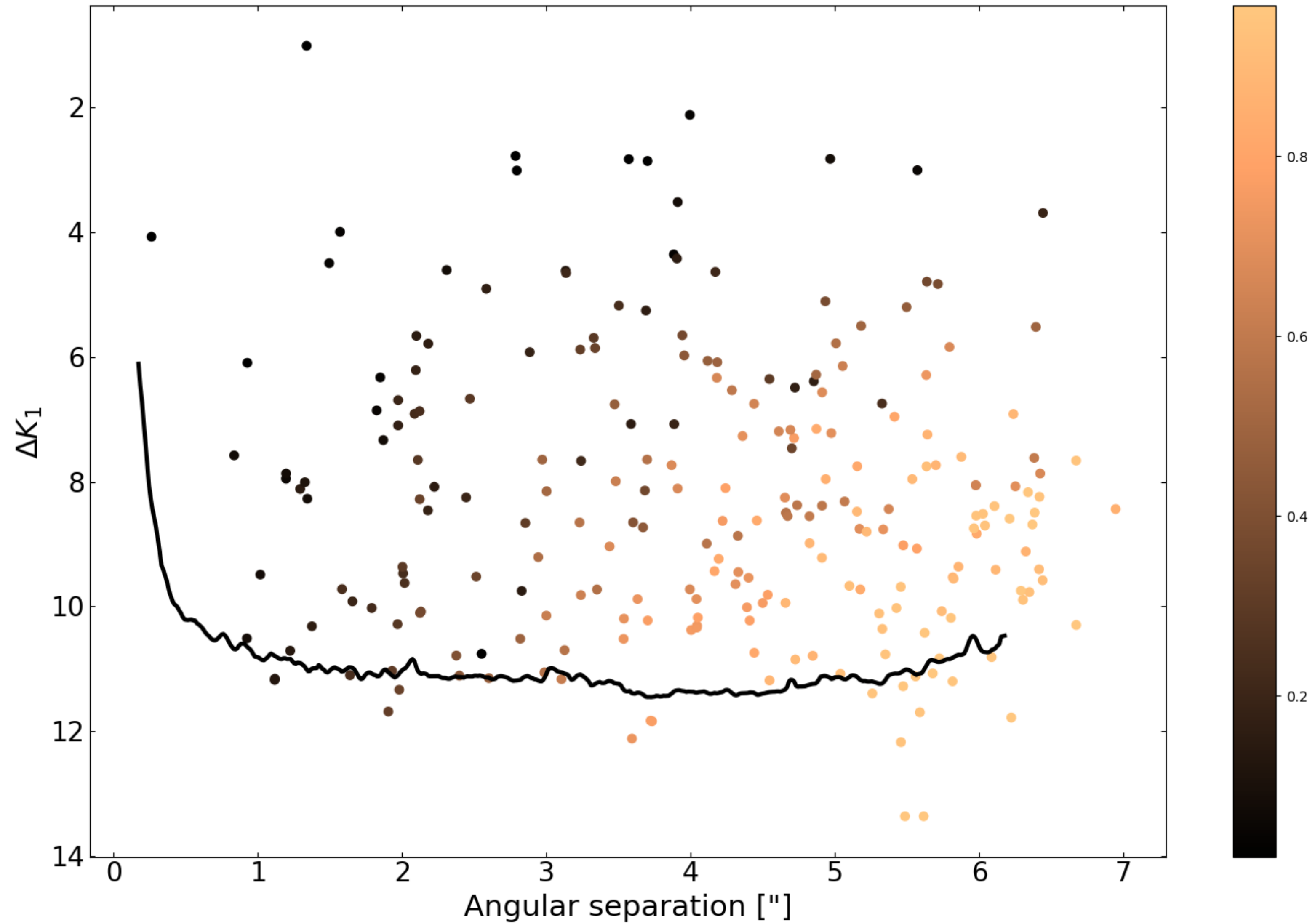
$5.37 \times 10^5 \text{ yrs}$

SMaSH+ (Sana+, 2014) & HST-FGS (Aldoretta+, 2015)



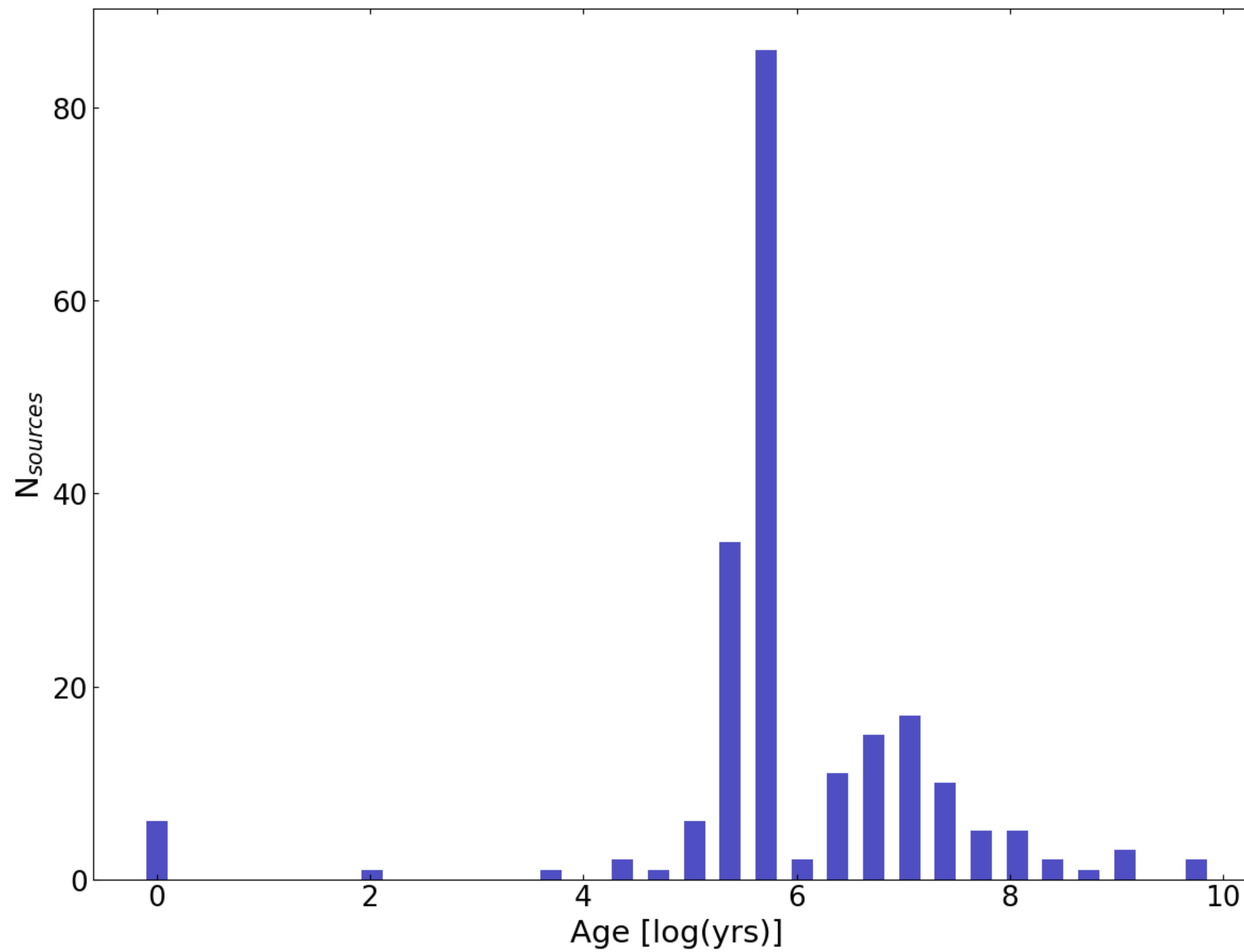
(Rainot+ in prep.)

Δmag vs radial separation



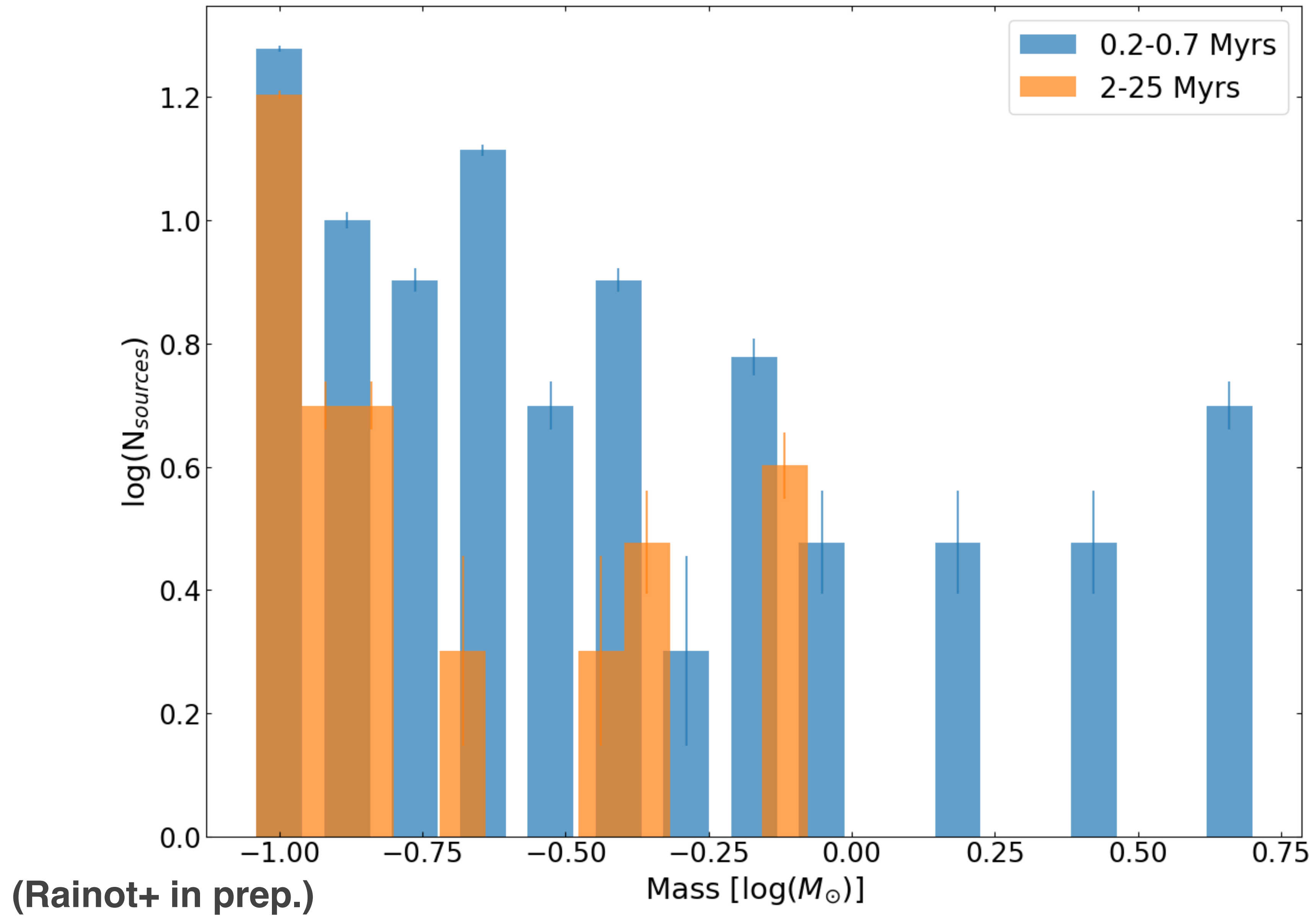
(Rainot+ in prep.)

Age distribution



(Rainot+ in prep.)

Mass distribution



Trumpler 14

- 210 sources detected
- 50 highly likely to be bound
- Most sources have an age of $\sim 5 \times 10^5$ yrs
- Mass range between 0.1 and 0.3 M_{\odot}
- No apparent over-density
- ~ 0.14 multiplicity fraction in IFS FoV

Sco. OB1

- ▶ **Older** (6-8Myrs) population of O-stars and B supergiants
- ▶ 39 stars: 15 **observed**, 14 in the future
- ▶ **Lower** IFS multiplicity than CHIPS: 0.20 companions/ star vs 0.43 for CHIPS
- ▶ **Aim**: Evolution study of multiplicity with age

Multiplicity Results - IFS

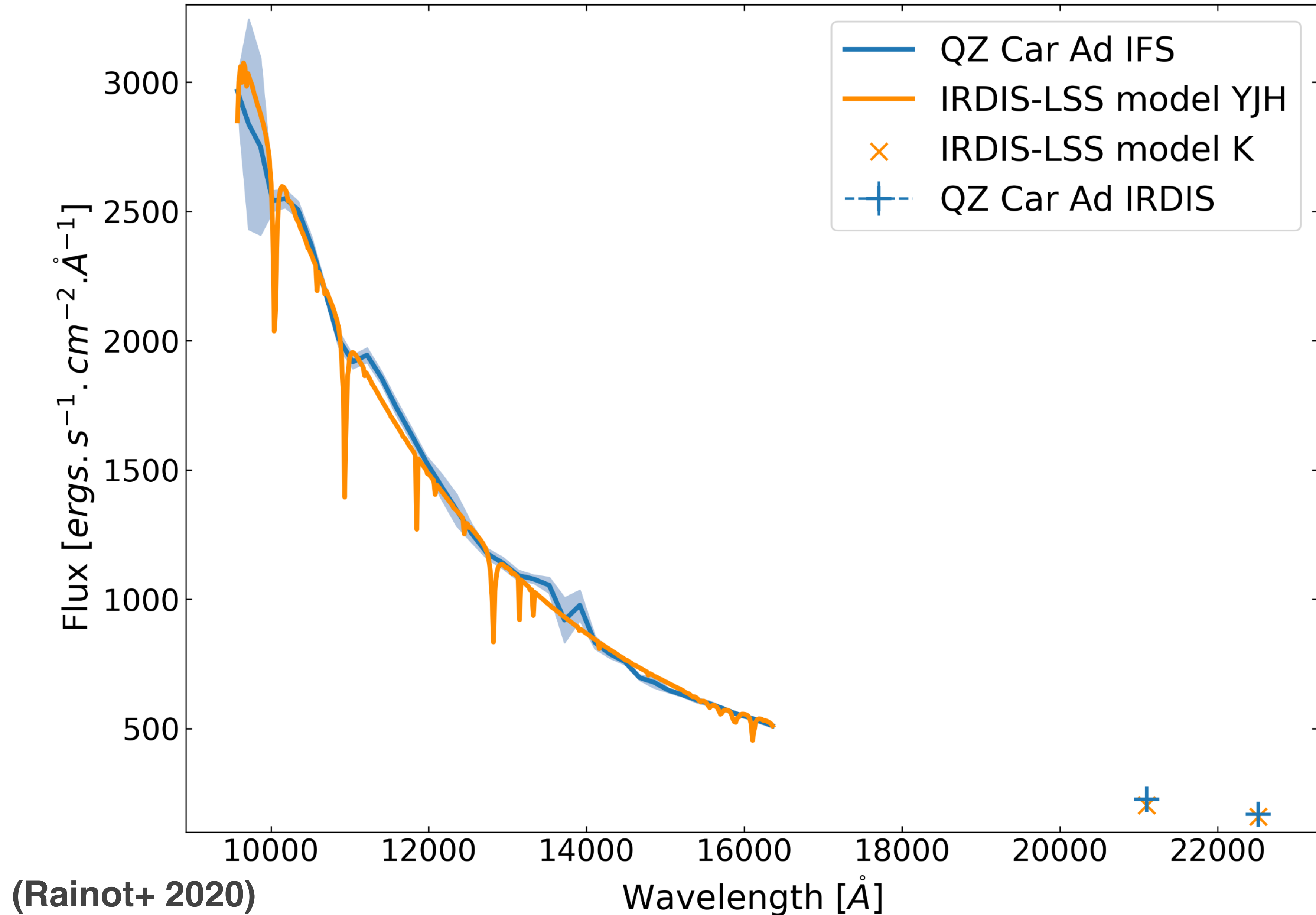
Images	Visible companions ($\text{SNR} > 5\sigma$)	Candidates ($5\sigma > \text{SNR} > 3\sigma$)
46	15	19

- ▶ Detection ratio ≈ 0.42 companions/star
- ▶ Expected ≈ 40 companions / 93 images

Future work

- ▶ 85 stars to analyse including 47 to observe
- ▶ Bias correction using the whole sample
- ▶ Development of SHIPS
- ▶ Complementary observations with high-resolution spectrographs

With better spectroscopy



Conclusion

- ▶ Detect and analyse stars at previously unobserving windows
- ▶ Reach contrast magnitudes of $\Delta m \sim 14$
- ▶ Obtain masses, ages, and other stellar parameters
- ▶ Larger sample yet to be analysed

Thank you!