

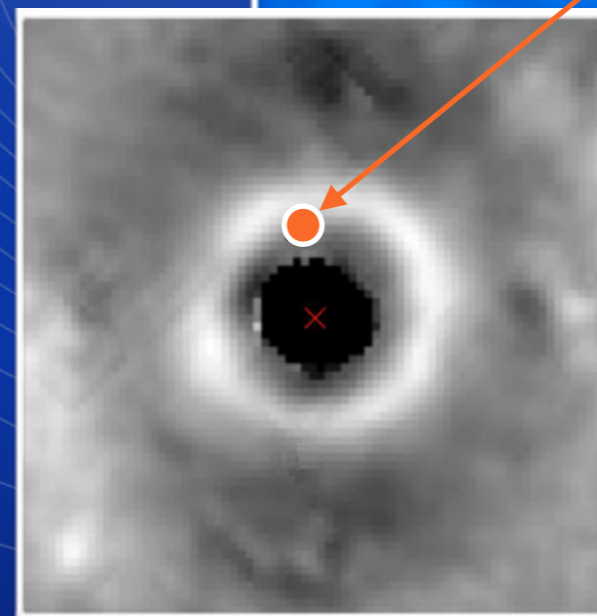
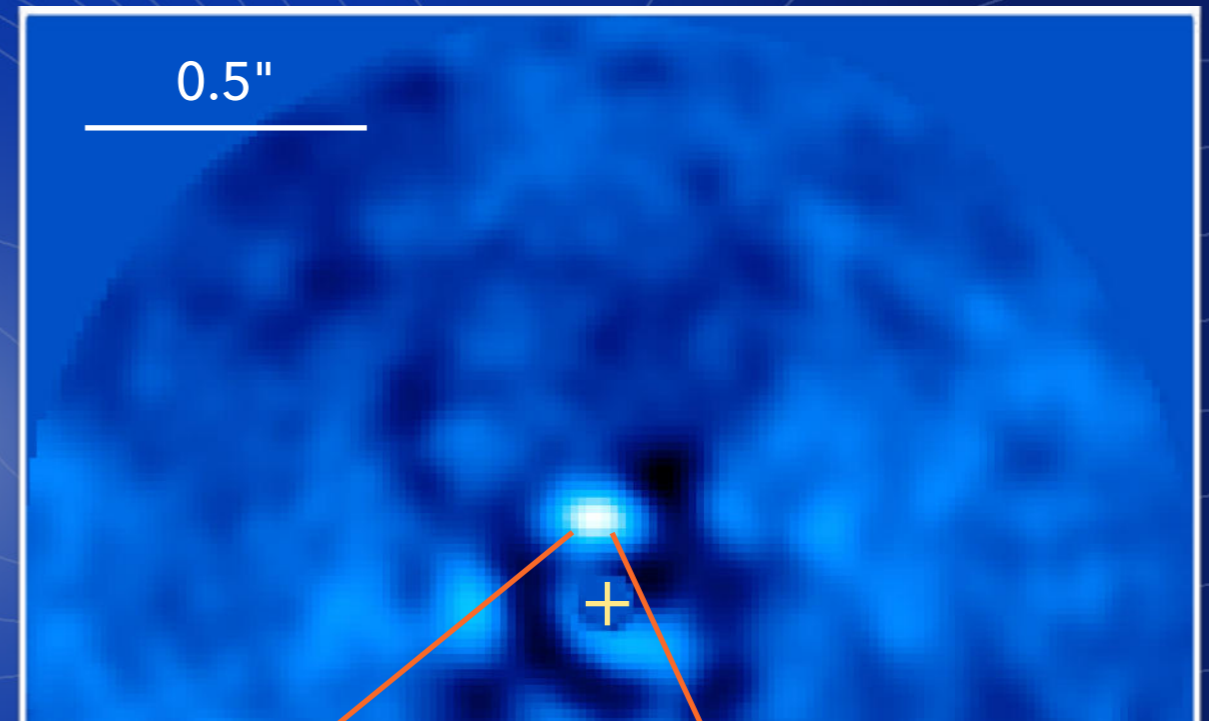


# SCIENTIFIC RESULTS

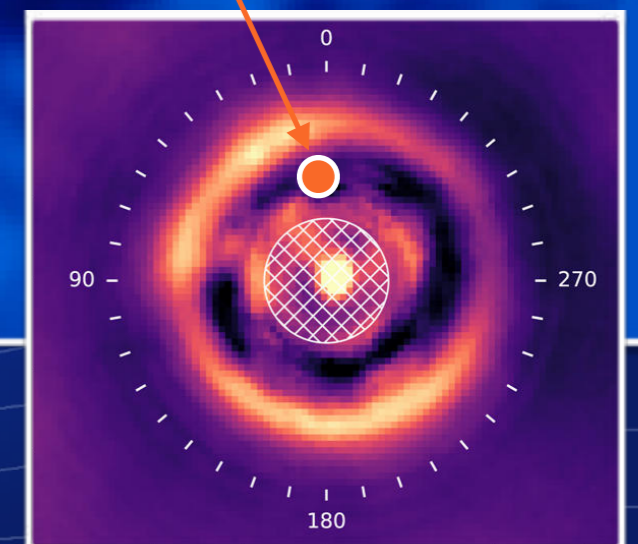
# EARLY SCIENCE @ VLT/NACO: HD 169142

Biller et al. 2014, Reggiani et al. 2014

- ▶ point-like source at 0.15" from Herbig Ae star, inside H-band PDI inner cavity
- ▶ not detected at J band (GPI) nor H-K bands (MagAO)
- ▶ possible explanations
  - \* accreting protoplanet?
  - \* disk feature?



Quanz et al. 2013

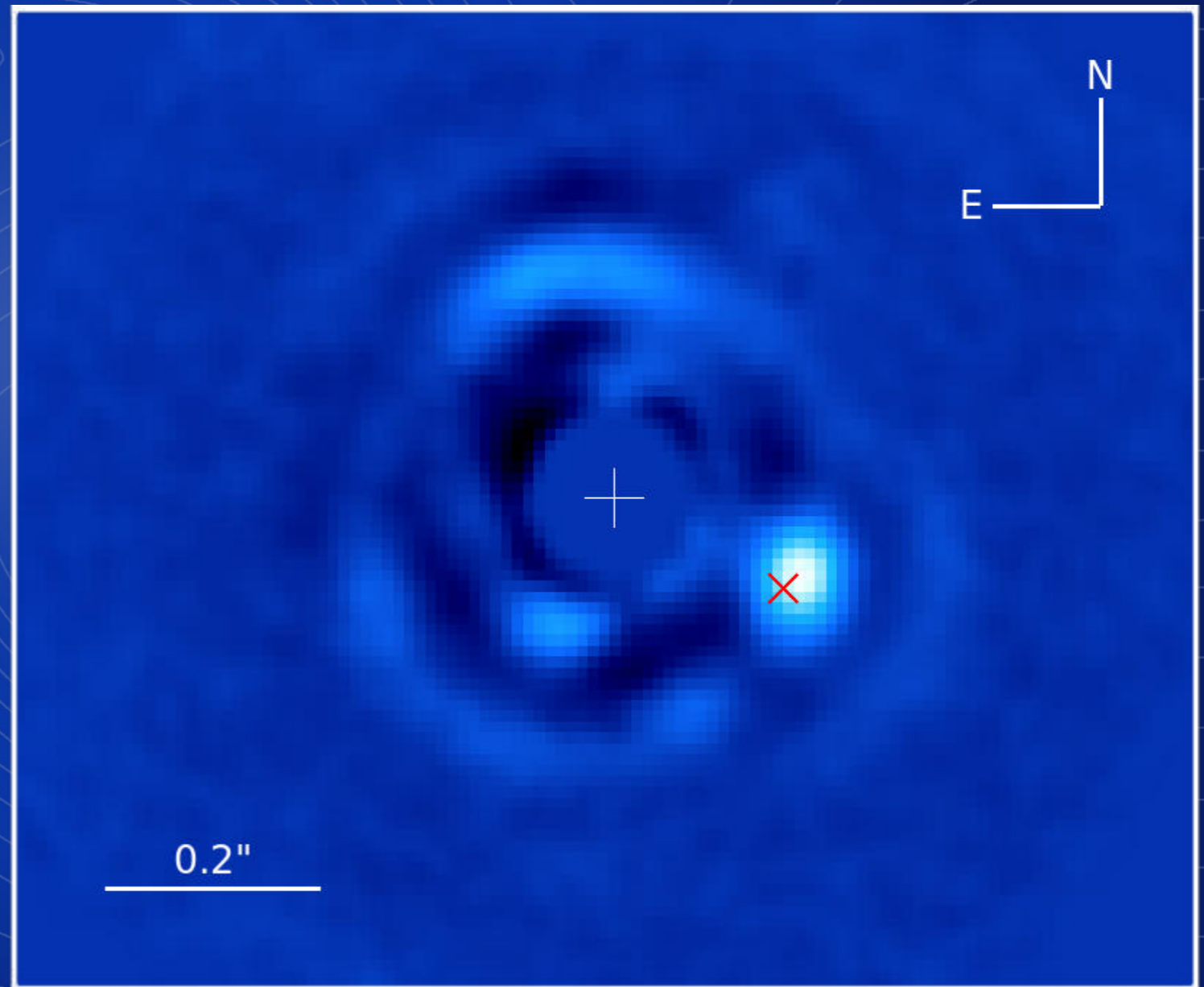


Ligi et al. 2018

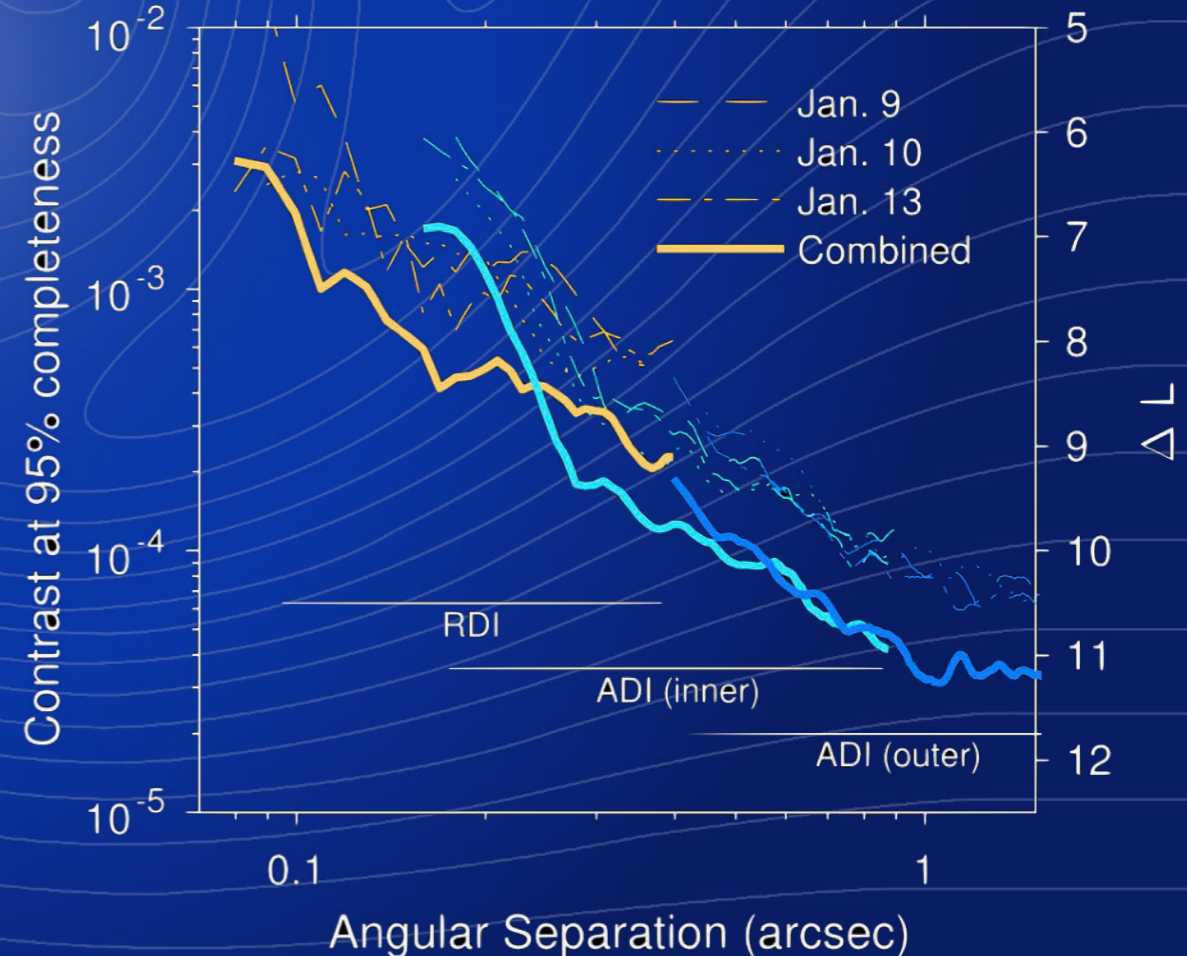
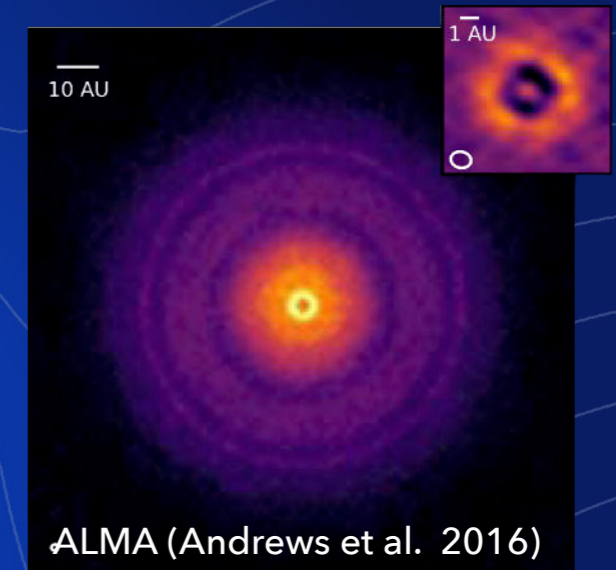
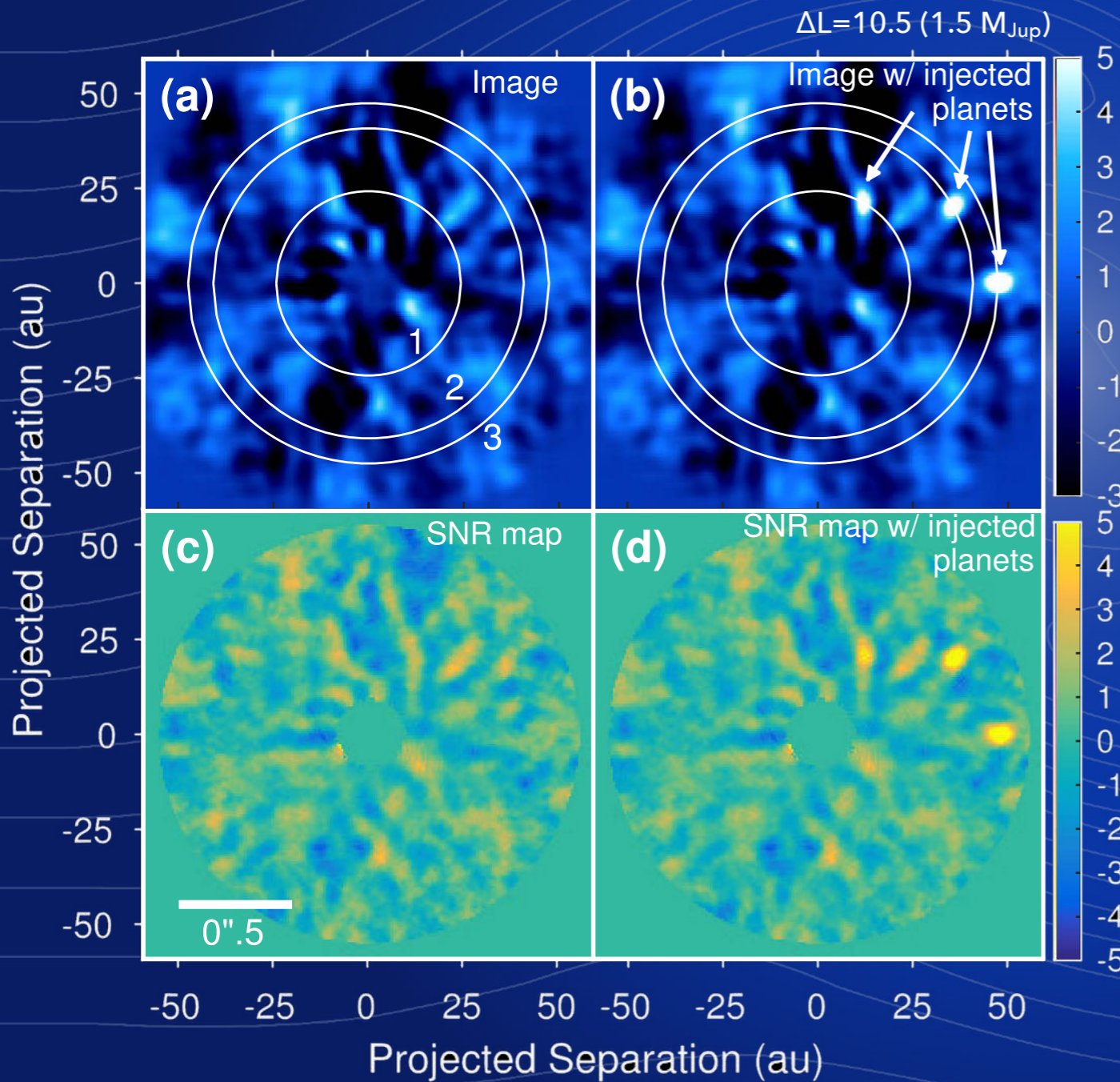
## FIRST LIGHT @ KECK/NIRC2: HIP 79124

Serabyn et al. (2017)

- ▶ brown dwarf around Sco-Cen A0 star
- ▶ 177 mas,  $\Delta L=4.3$
- ▶ only detected with aperture masking so far
- ▶ recovered with NIRC2+vortex during commissioning

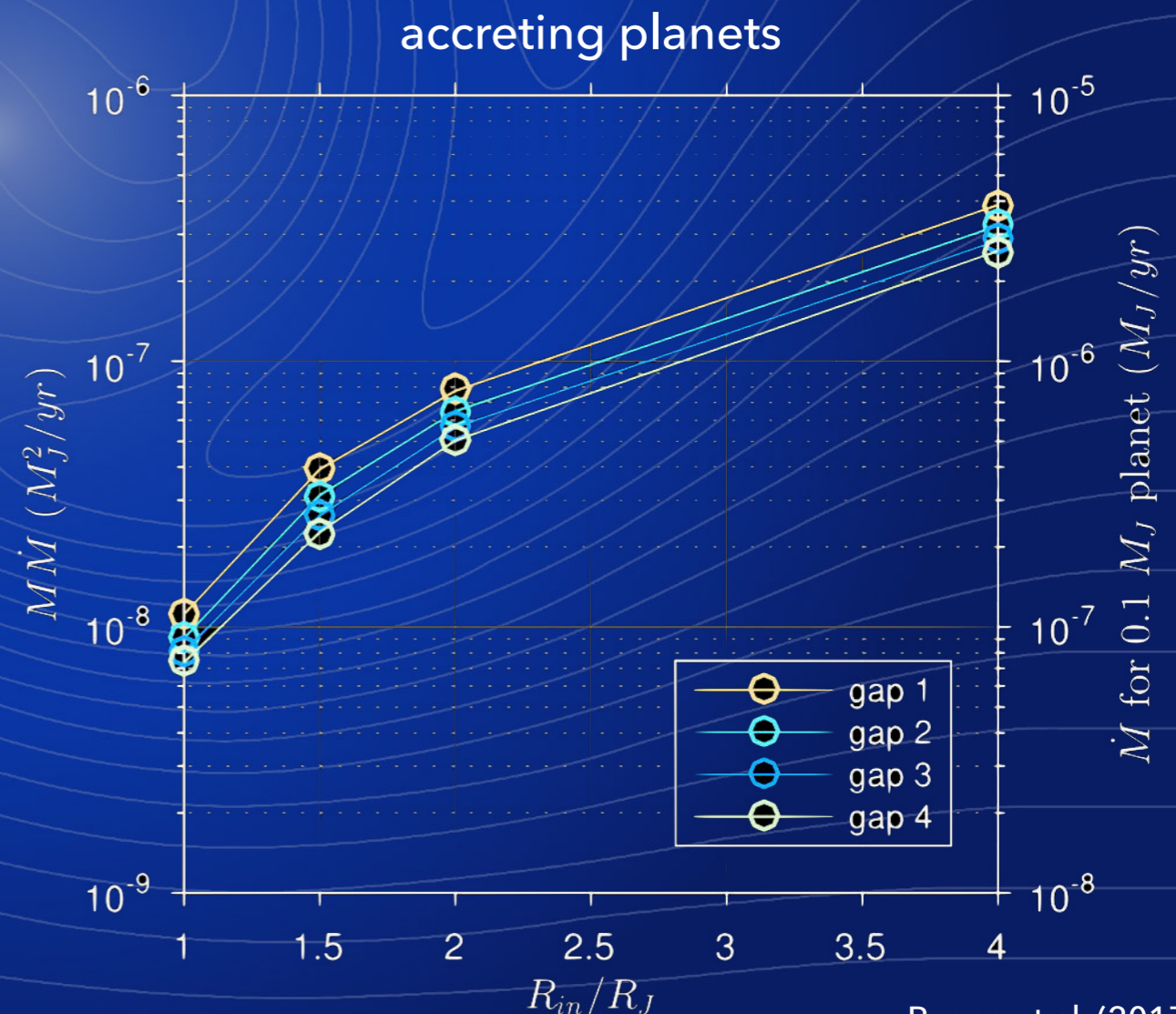
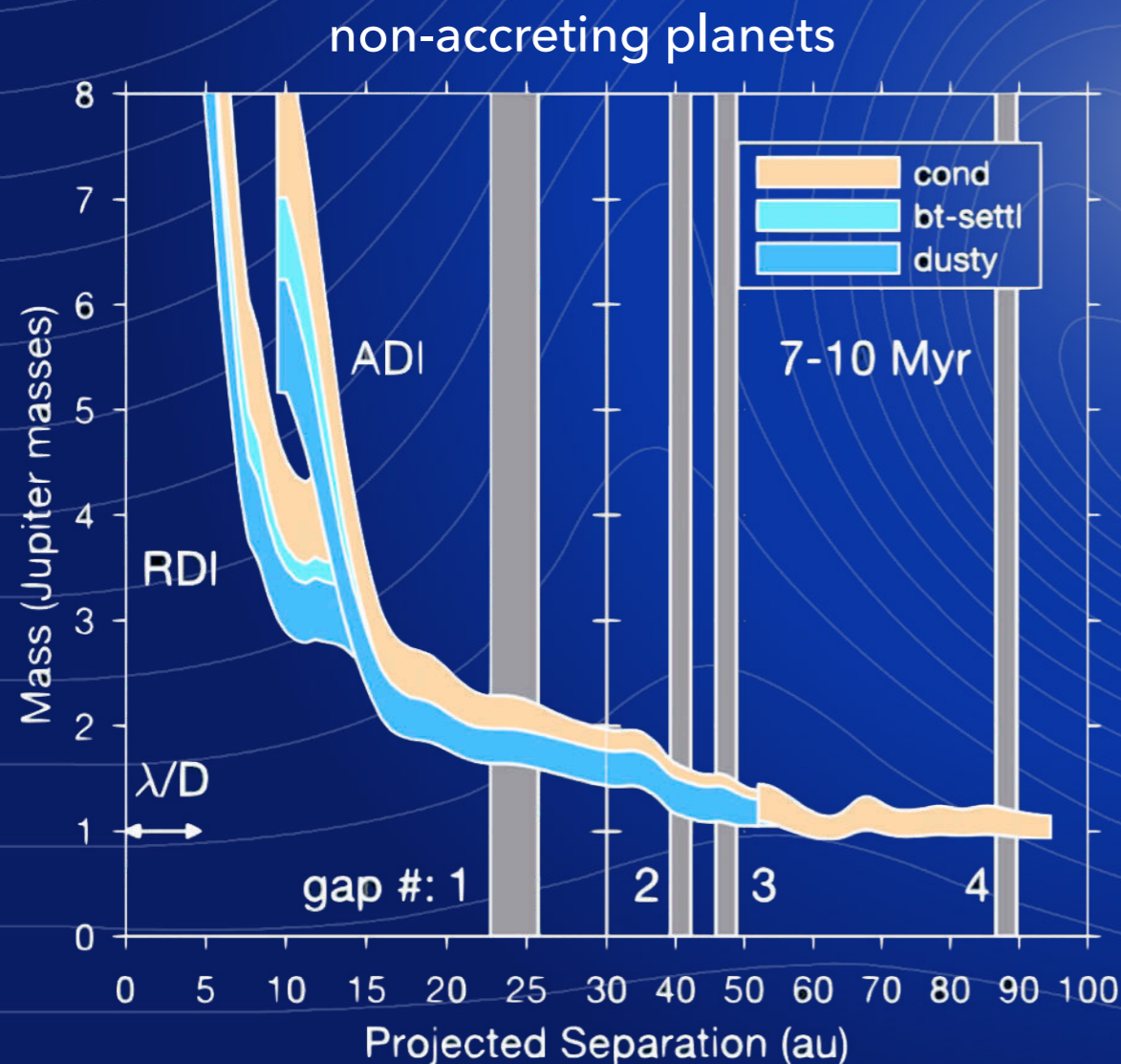


# KECK CORONAGRAPHIC DEEP FIELD: TW HYA



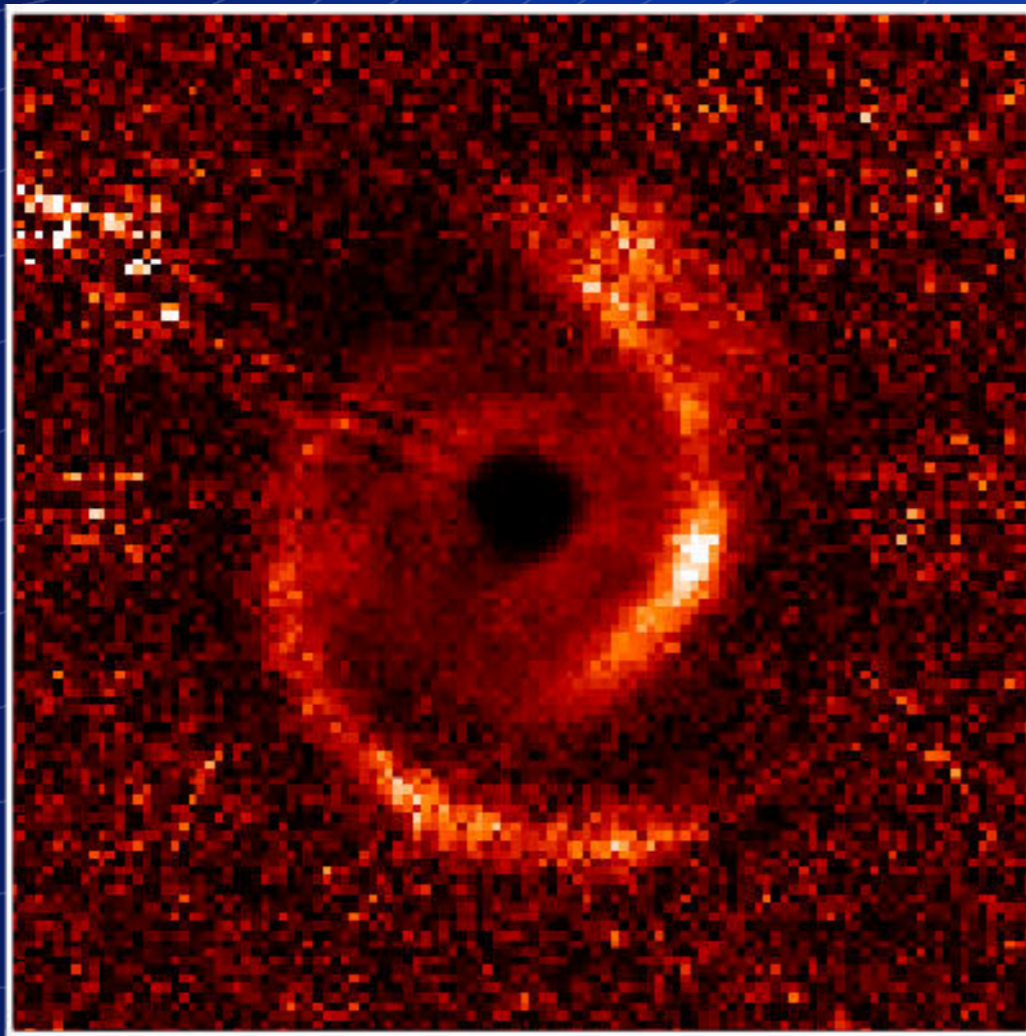
# CONSTRAINING (PROTO)PLANETS IN TW HYA DISK

- ▶ protoplanet with circumplanetary disk truncated at  $\sim 1 R_{Jup}$  presently accreting at a rate insufficient to form a Jupiter-mass planet

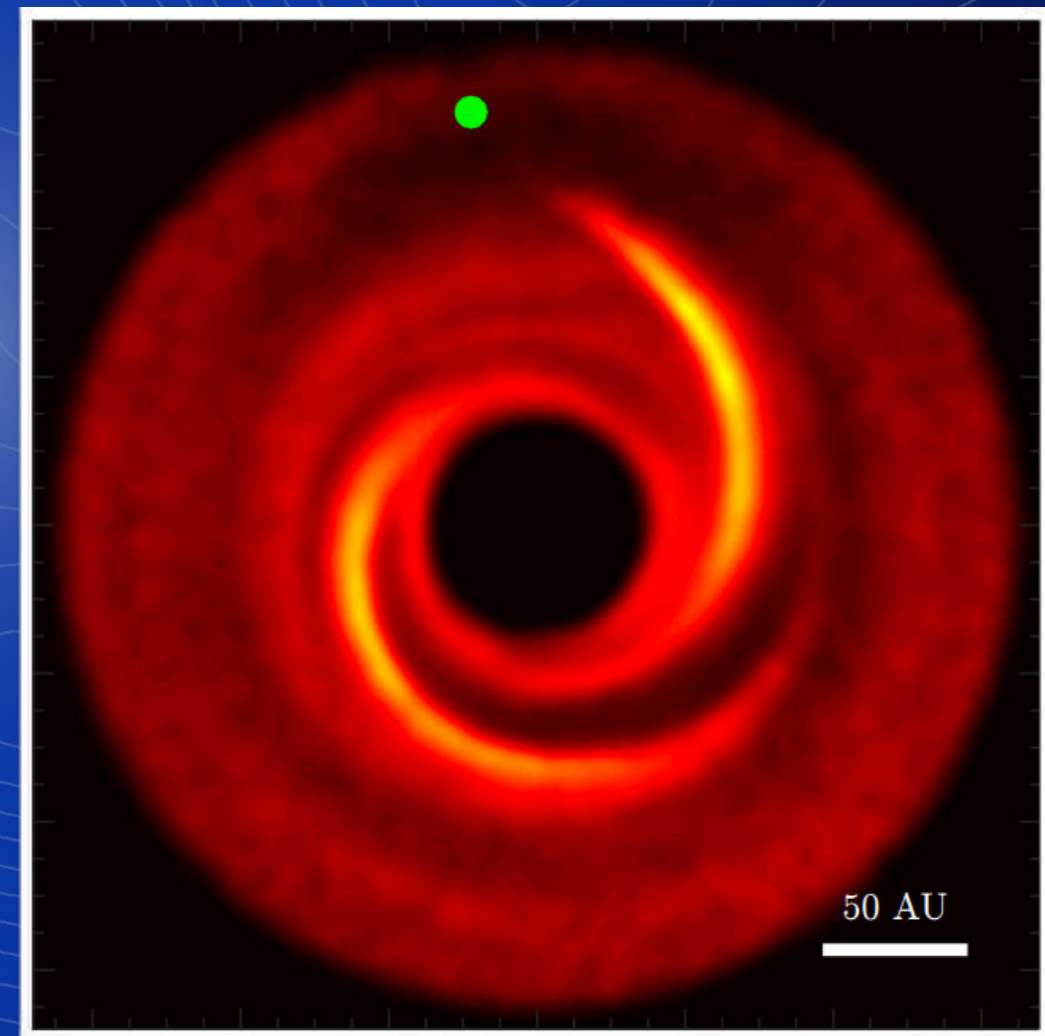


## TRANSITION DISK SURVEY (NIRC2 & NACO)

SPHERE/IRDIS Y band polarimetry (Benisty et al. 2015)

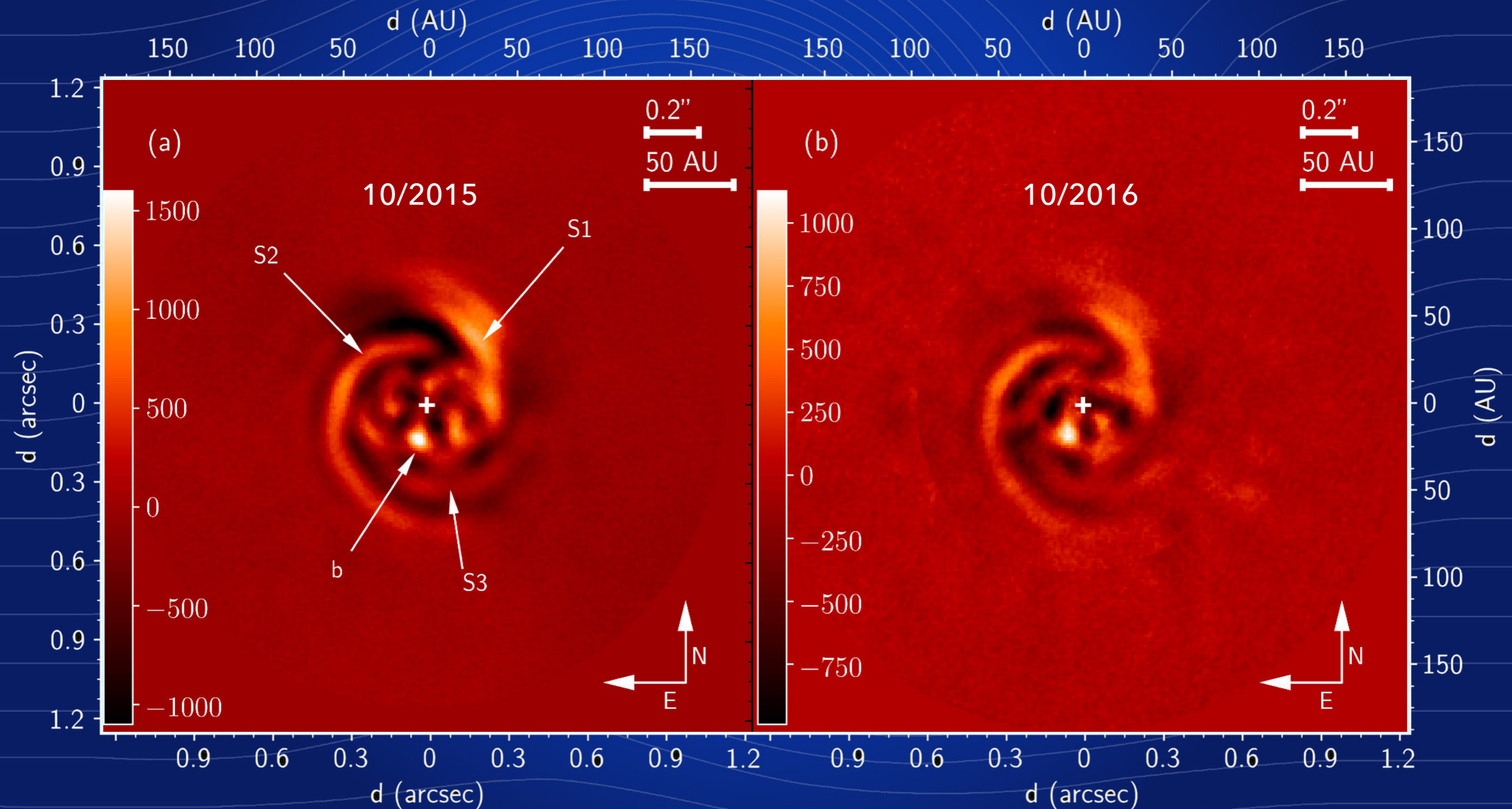


Protoplanet prediction (Dong et al. 2015)



goal: search for protoplanets at the origin of disk structures

# THE KECK/NIRC2 + VORTEX VIEW OF MWC758



# MWC758: YET ANOTHER PROTOPLANET CANDIDATE?

## ▶ main properties

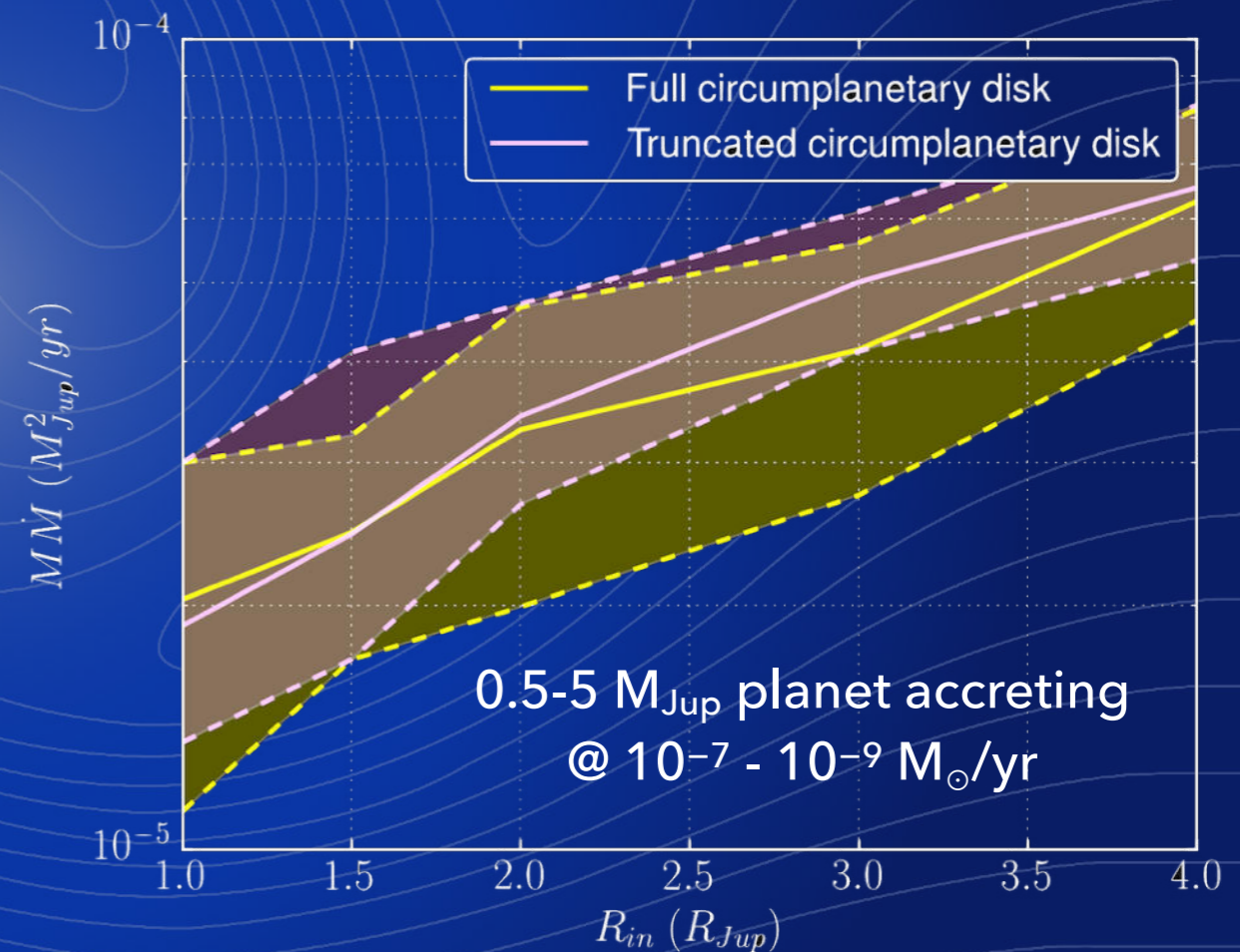
- \* 0.1'' separation (20 au),  $\Delta L = 7$
- \* two epochs: PA difference consistent with Keplerian rotation in 1 yr

## ▶ low probability for bckg star

- ▶ companion? needs to be  $< 6 M_{\text{Jup}}$   
→ not purely photospheric emission

## ▶ conclusion: accreting protoplanet or disk feature?

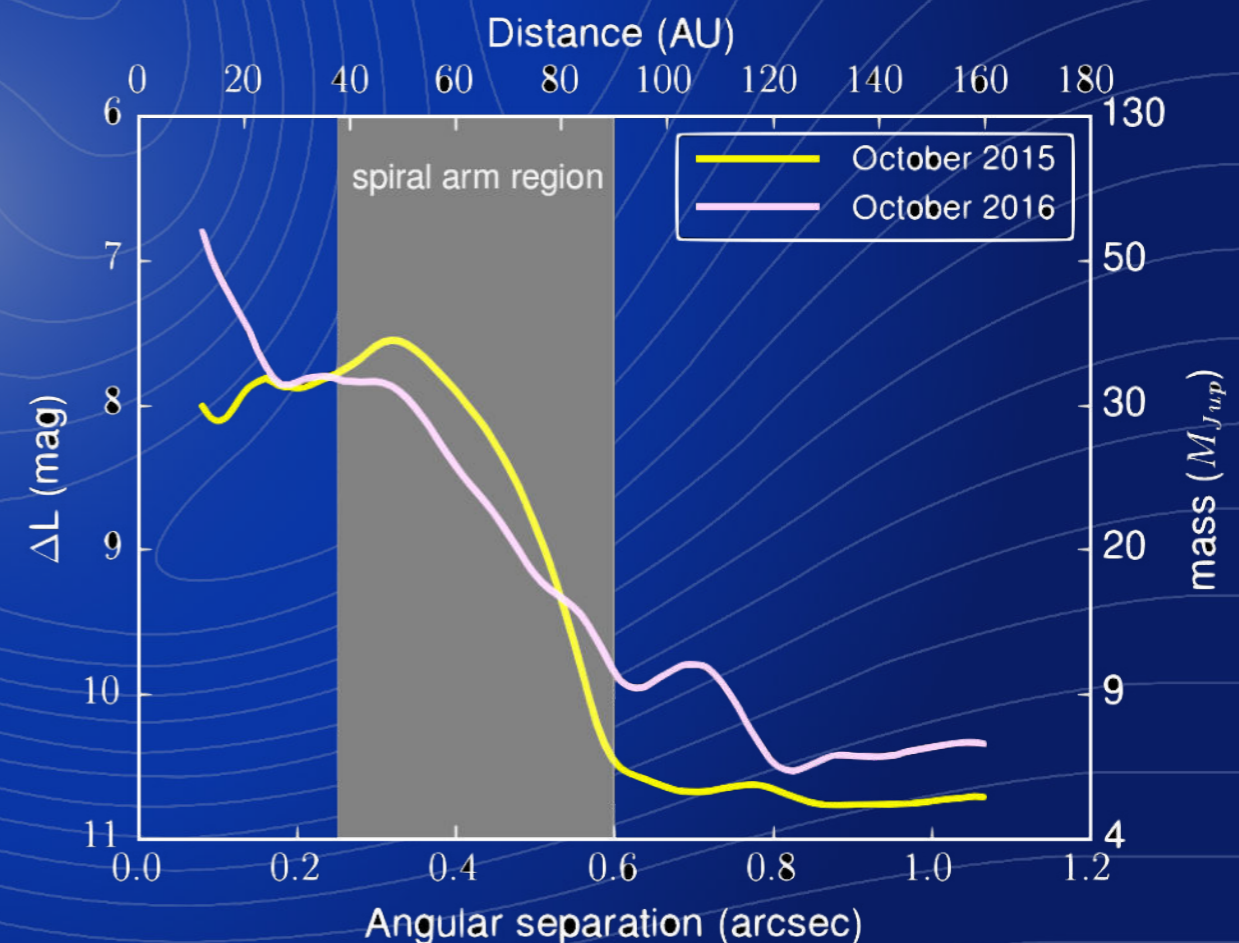
- \* no polarized disk emission there!





# MWC758: ORIGIN OF THE SPIRALS?

- ▶ now three spiral arms to reproduce with models
- ▶ driven by protoplanet?
  - \* outer planet? most likely explanation based on models, but strong constraints from observations ( $< 6 M_{\text{Jup}}$ )
  - \* inner planet? might explain one spiral, but not all three

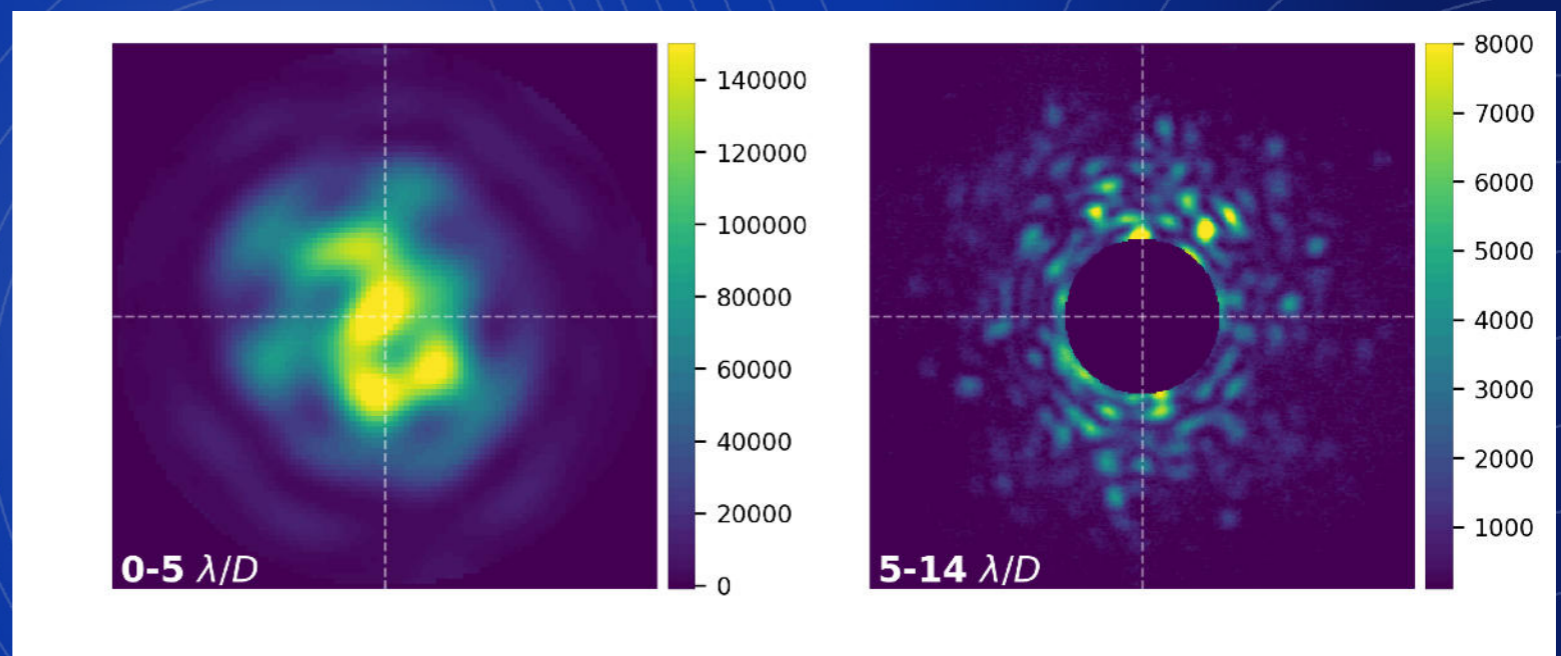


## HOW TO BETTER EXPLOIT THE DATA?

▶ interesting science at 1-3  $\lambda/D$

- \* strongly affected by residual speckles
- \* non-Gaussian noise  
→ more false positives
- \* hard to validate candidates

NIRC2+vortex image sequence



- ▶ ADI-based techniques produce SNR, but do not inform on nature of the source
- ▶ machine learning can help

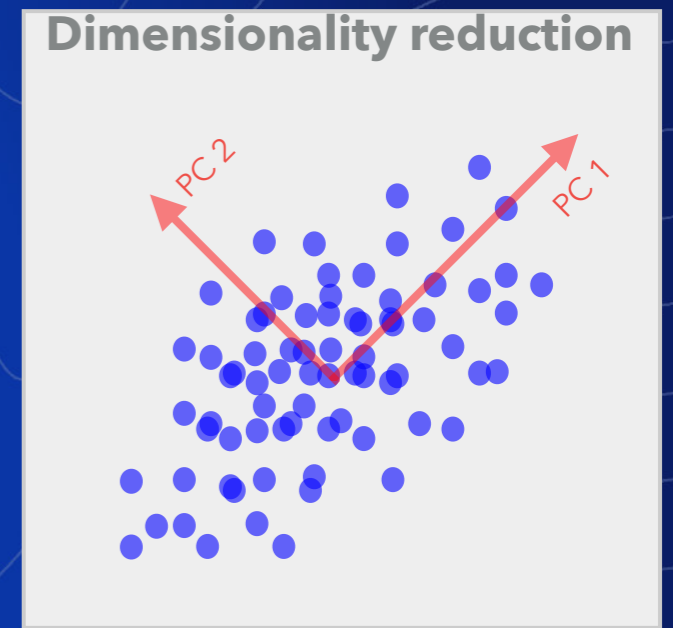
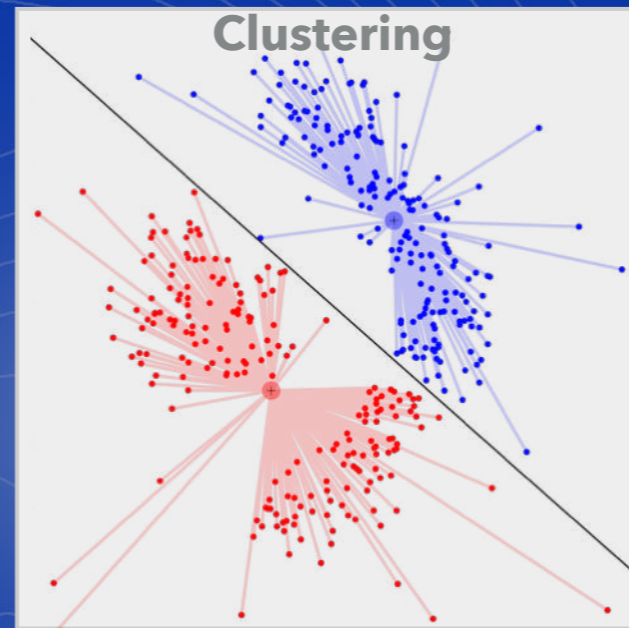


**IMAGE PROCESSING  
WITH  
MACHINE LEARNING**

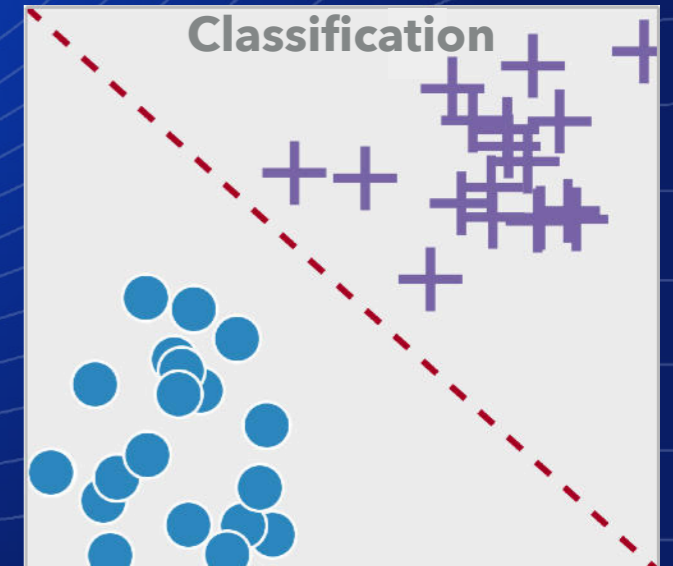
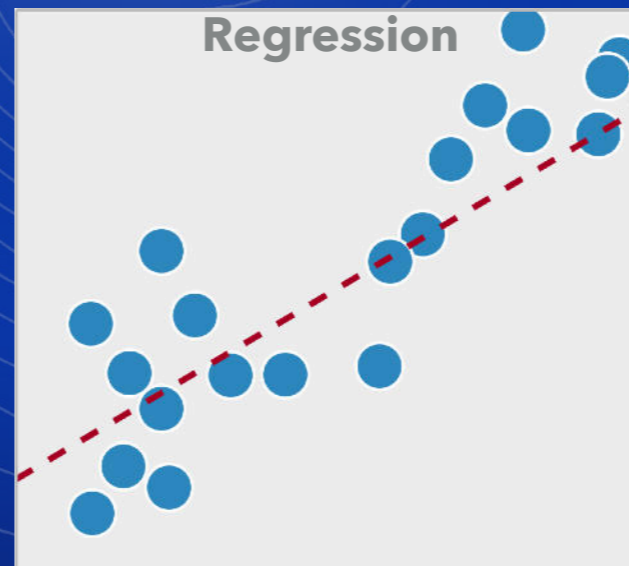
# MACHINE LEARNING IN A NUTSHELL

- ▶ construction of algorithms that can learn from, and make predictions on data

Unsupervised



Supervised



## SUPERVISED LEARNING

- ▶ goal: learn function  $f$  mapping input samples  $\mathcal{X}$  to labels  $\mathcal{Y}$  given a labeled dataset  $(x_i, y_i)_{i=1, \dots, n}$  :

$$\min_{f \in \mathcal{F}} \frac{1}{n} \sum_{i=1}^n \mathcal{L}(y_i, f(x_i)) + \lambda \Omega(f)$$

- ▶ mapping function  $f$  based on (deep) neural network
  - \* layers of neurons whose parameters can be tuned to approximate a complex function
  - \* DNN can be trained with labeled datasets
- ▶ problem: need labels & large training sample!

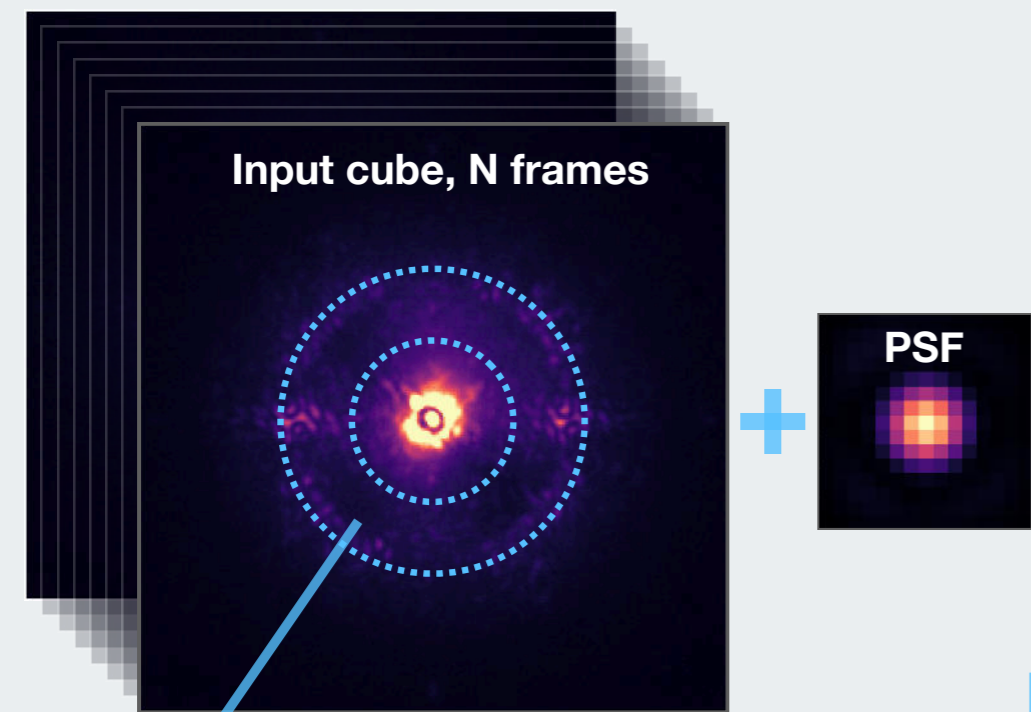
# SUPERVISED DETECTION OF EXOPLANETS

Gomez Gonzalez et al. (in press)

1. generation of labeled data

2. training the DNN

3. prediction



$X$  and  $y$  to train/test/validation sets

Convolutional LSTM layer  
kernel=(3x3), filters=40

3d Max pooling  
size=(2x2x2)

Convolutional LSTM layer  
kernel=(2x2), filters=80

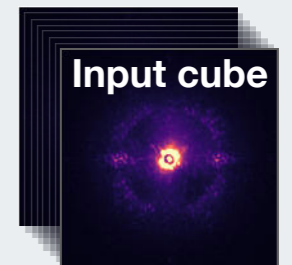
3d Max pooling  
size=(2x2x2)

Dense layer  
units=128

ReLU activation + dropout

Output dense layer  
units=1

Sigmoid activation



MLAR patches

Trained classifier

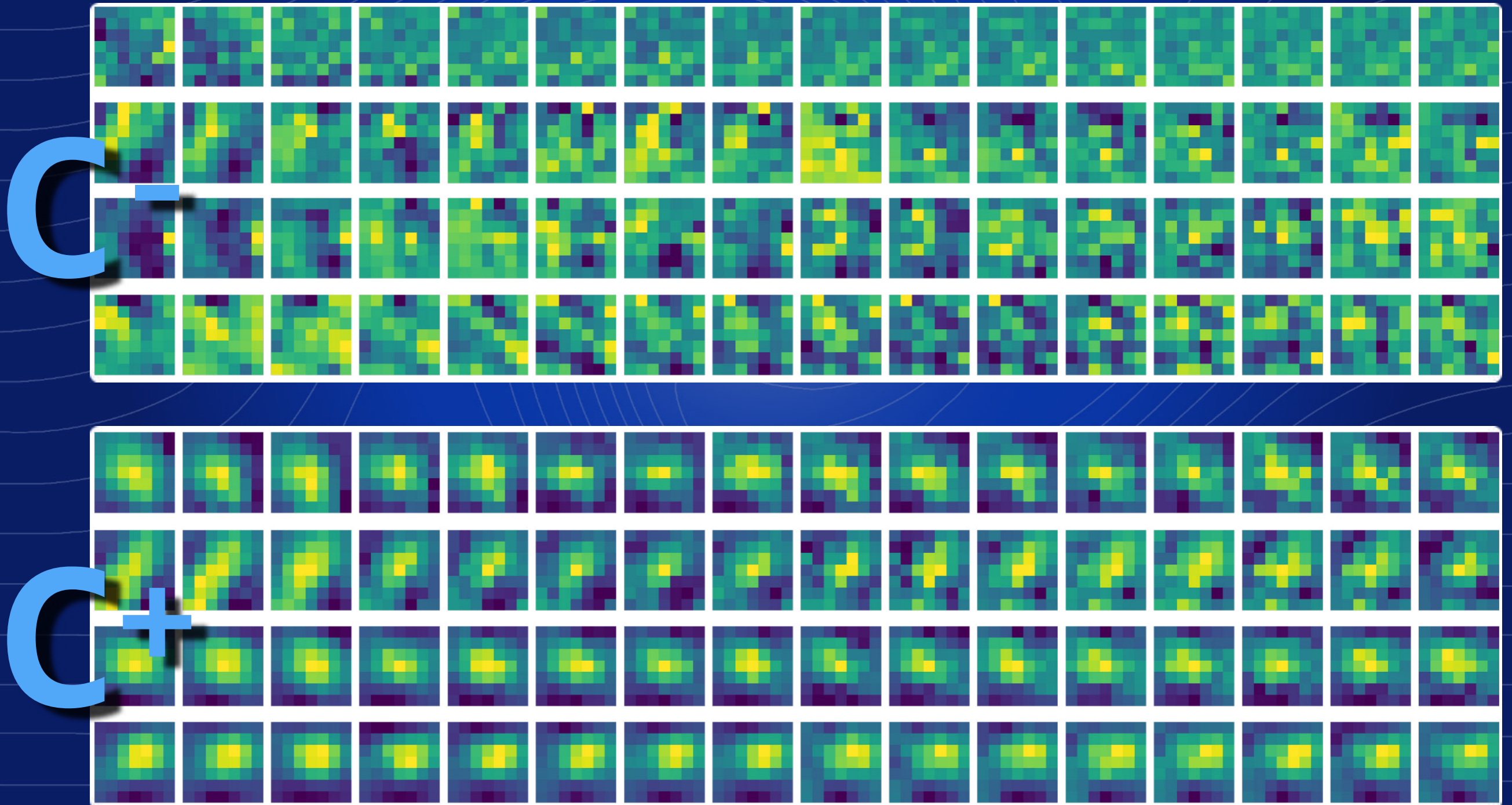
Probability of positive class

Binary map

probability threshold = 0.9

# LABELED DATASET

Labels:  $y \in \{c^-, c^+\}$



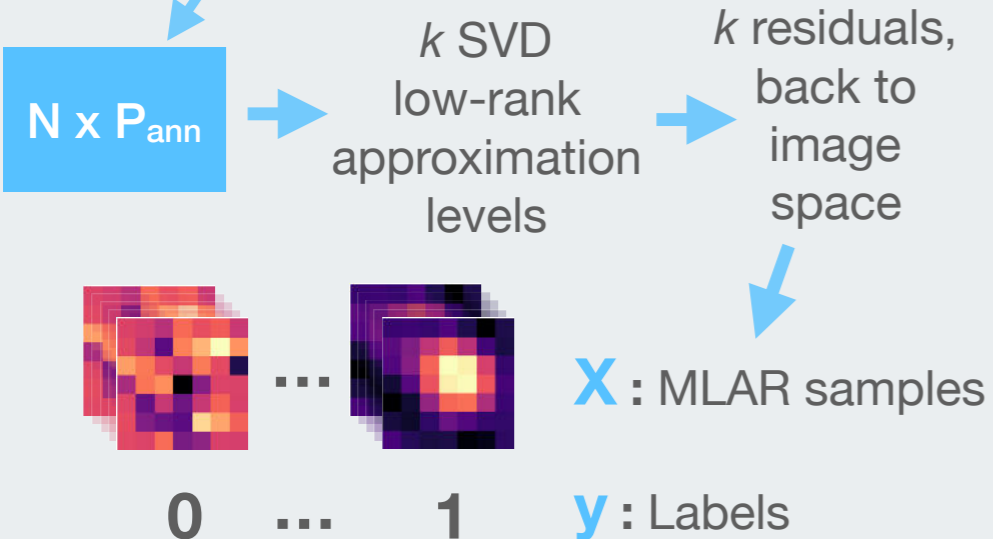
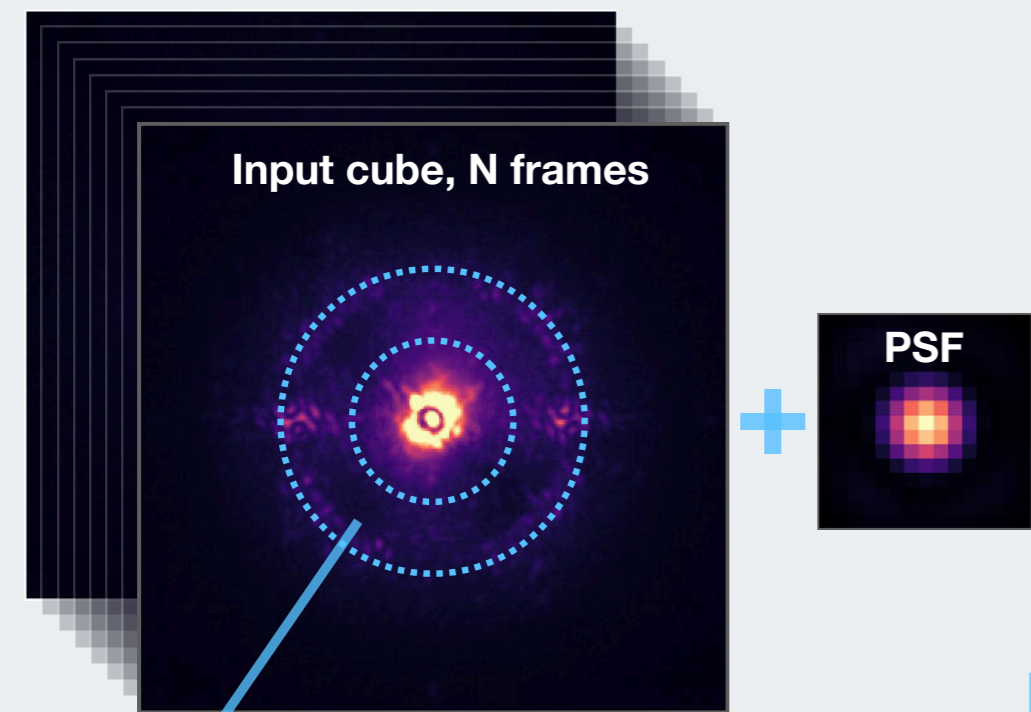
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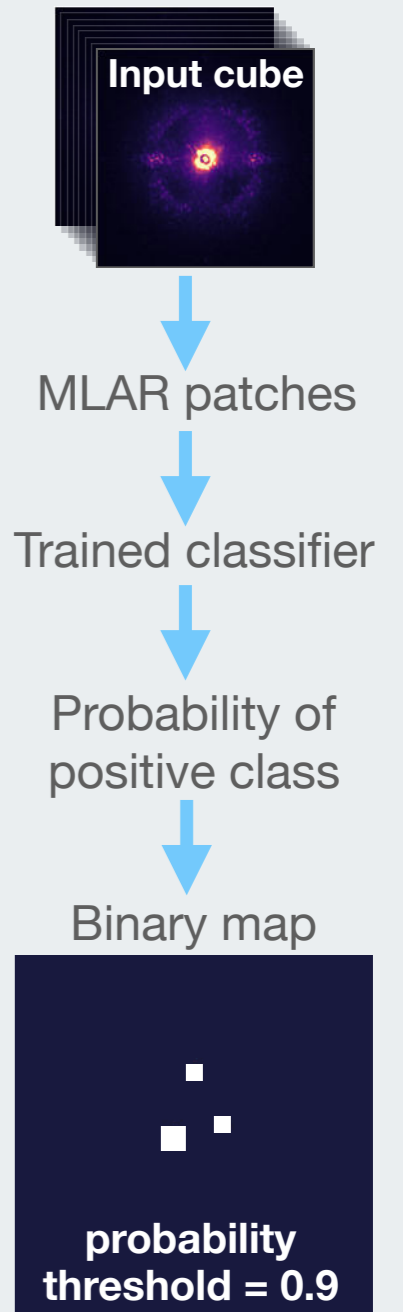
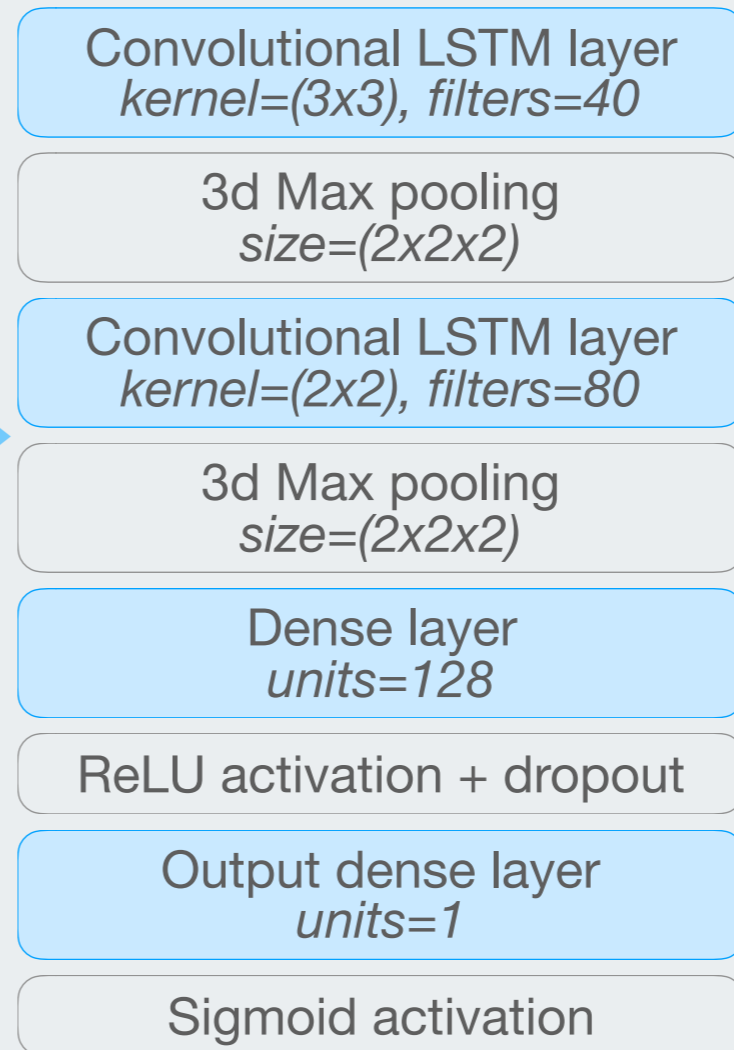
1. generation of labeled data

2. training the DNN

3. prediction

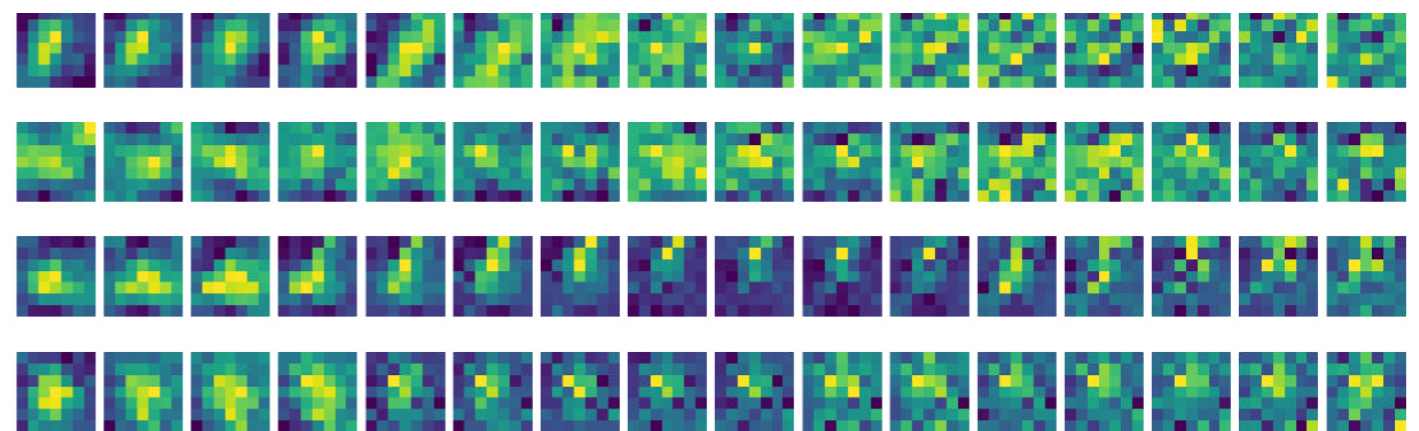
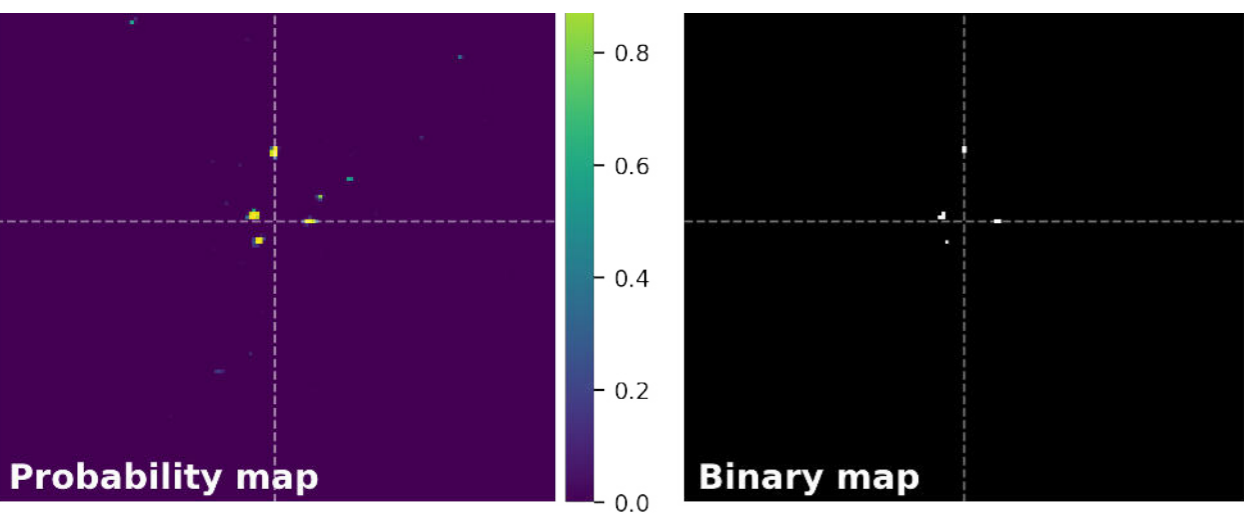
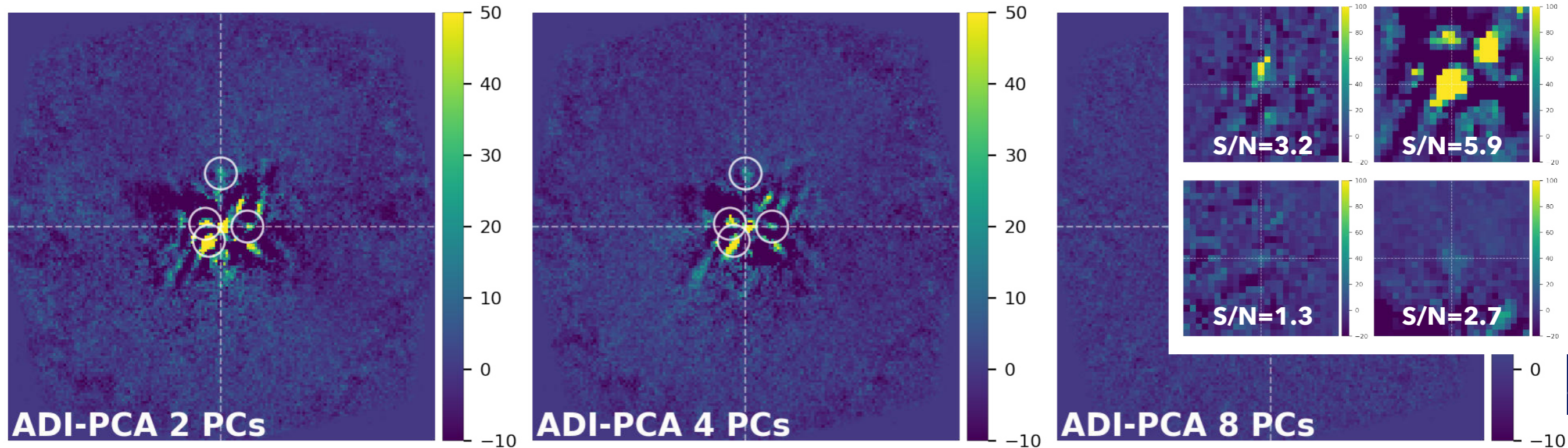


$X$  and  $y$  to train/test/validation sets





# TEST WITH INJECTED COMPANIONS (SPHERE/IRDIS)



MLAR patches of 4 fake companions

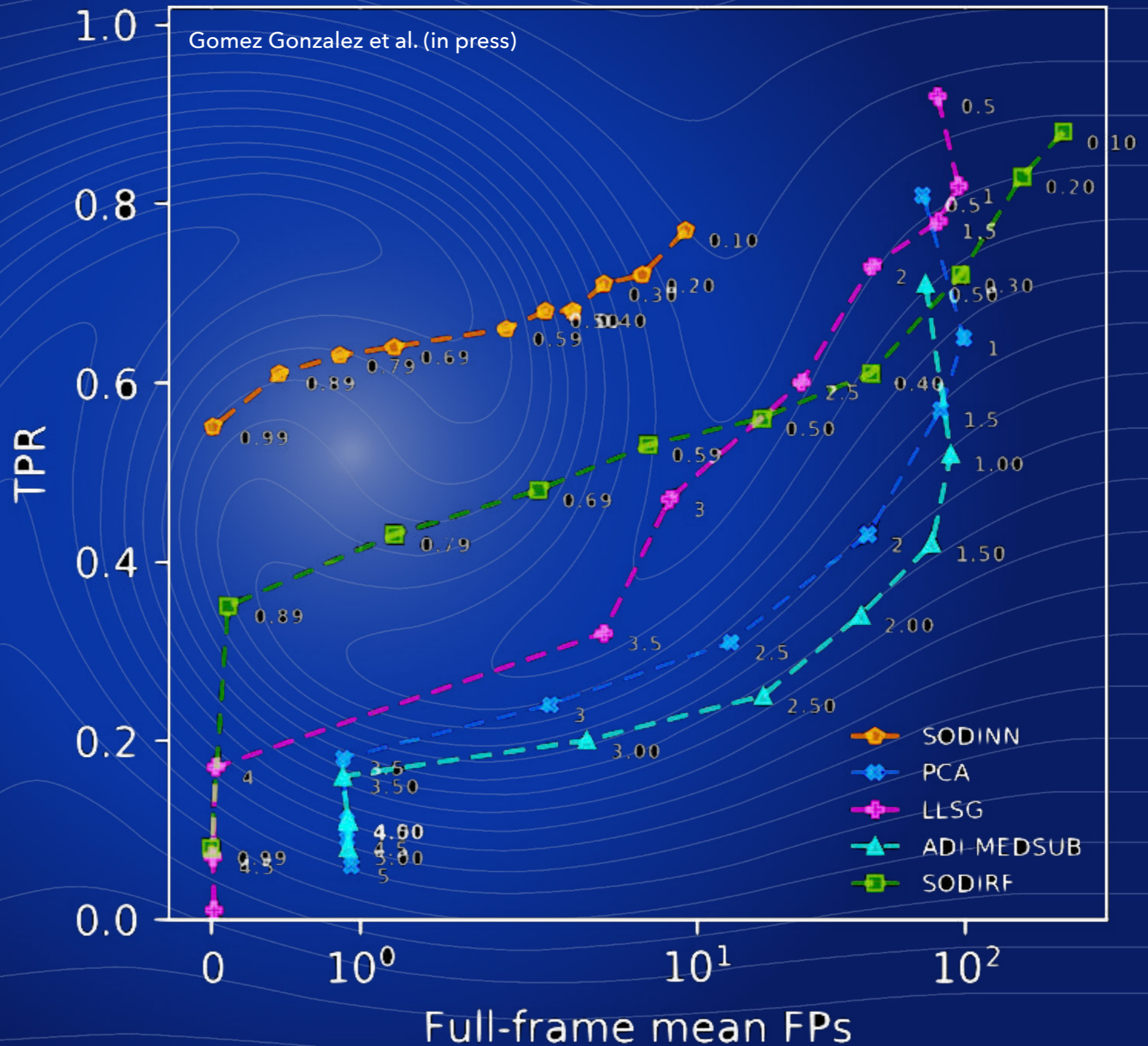
# ROC CURVES

► Separation

\*  $2 - 3 \lambda/D$

► Contrasts

\*  $2.9 \times 10^{-5}$   
to  $1.4 \times 10^{-4}$





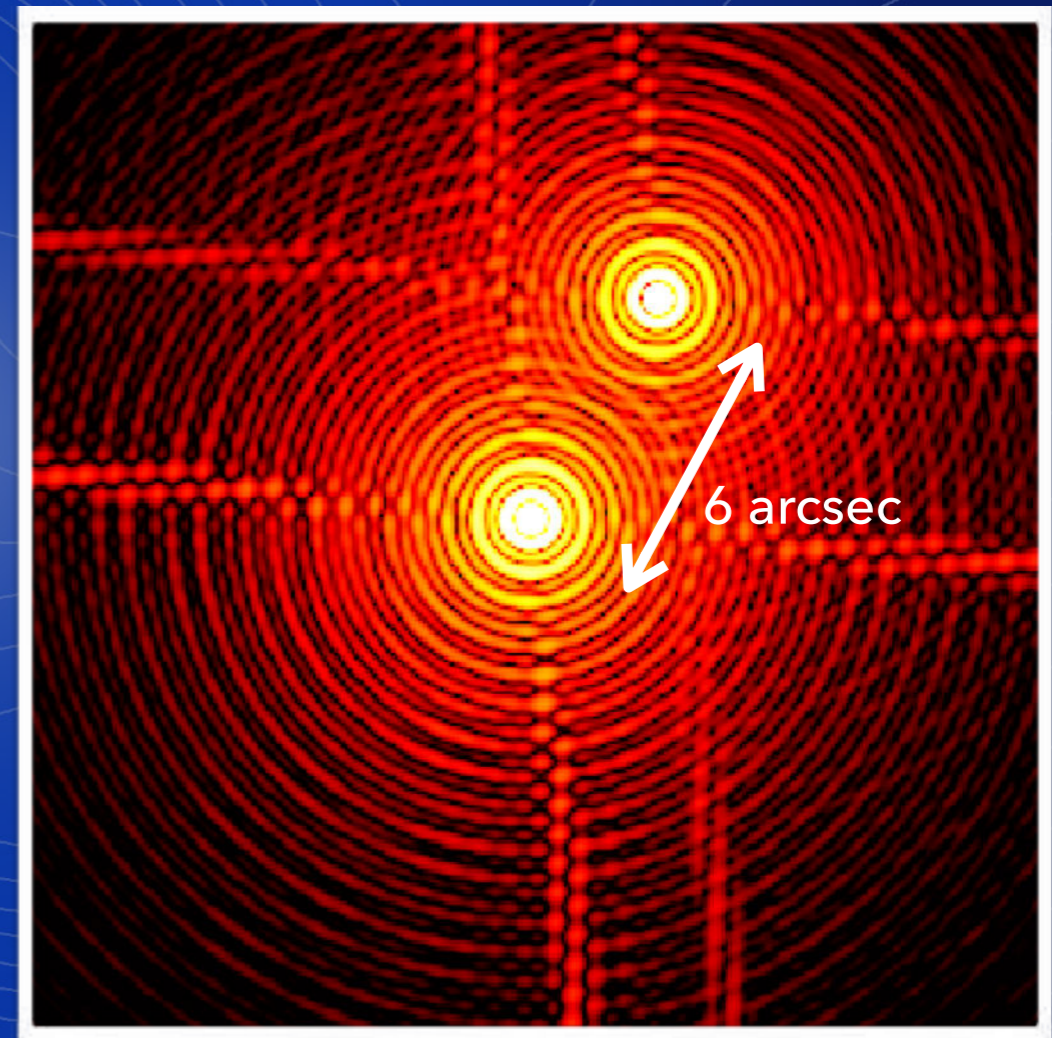
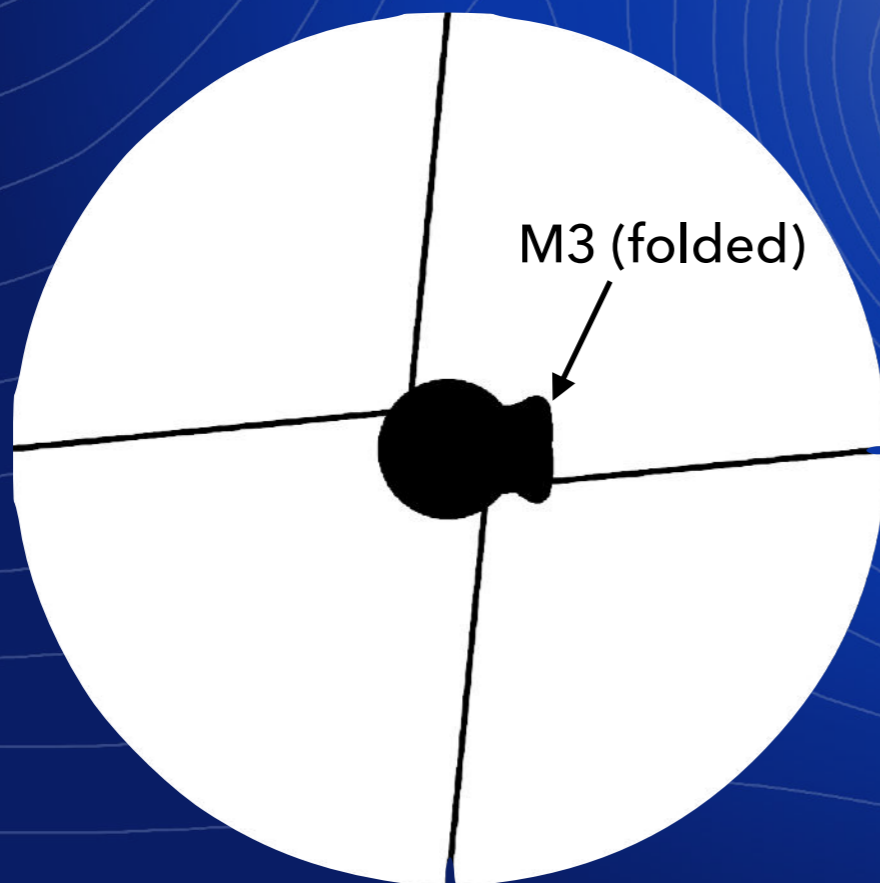
# FUTURE PROJECTS

## NEAR - NEW EARTH IN THE ALPHA CENTAURI REGION

- ▶ ESO project funded by Breakthrough Watch
  - \* what? search for rocky planets around  $\alpha$  Cen A&B
  - \* how? refurbish VISIR and put it behind UT4+AOF
  - \* when? 100h observing campaign in mid-2019
- ▶ vortex team contribution
  - \* provide optimized AGPM for 10-12.5 $\mu$ m filter
  - \* design optimized Lyot stop
  - \* develop closed-loop pointing control with QACITS

## NEAR LYOT STOP: TWO CHALLENGES

- ▶ binary target star
  - \* need to dim secondary star
- ▶ complicated pupil



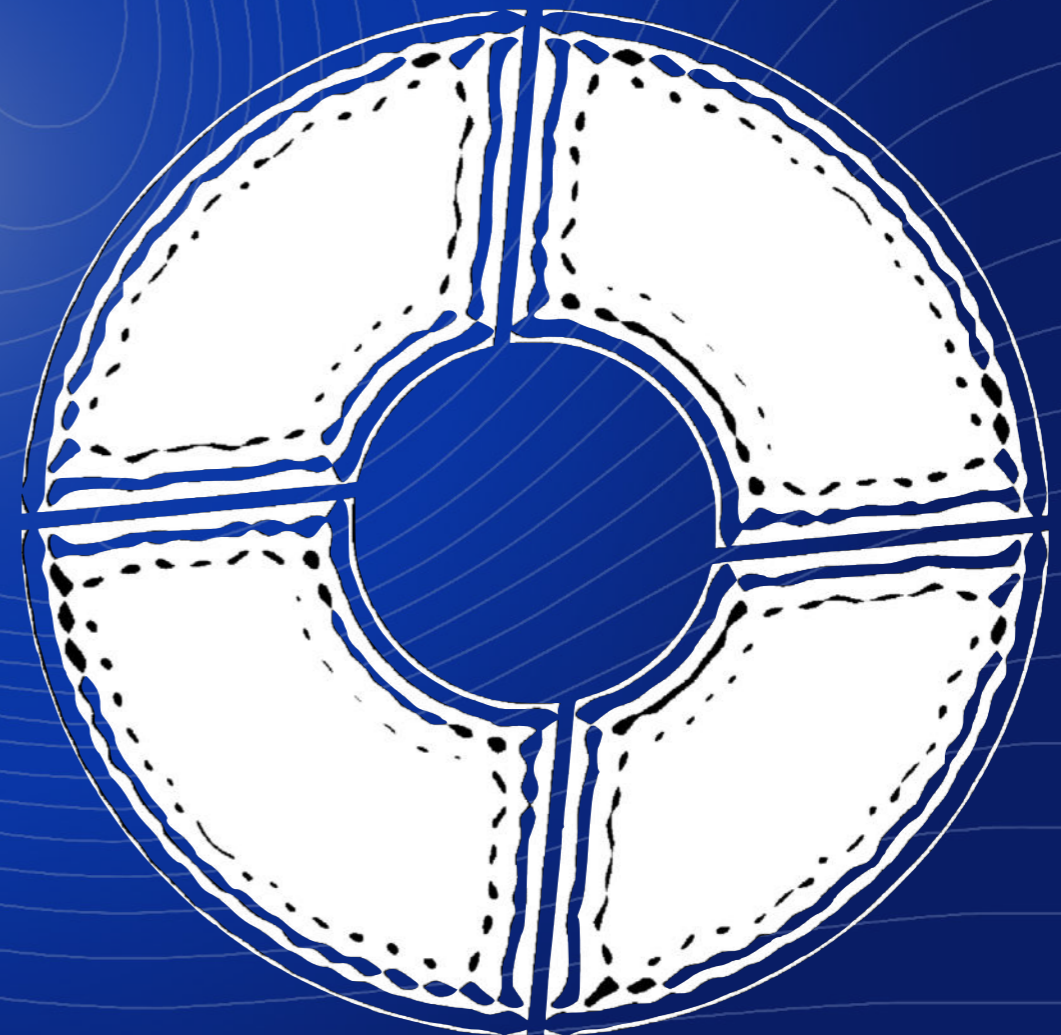
## AN APODIZED LYOT STOP

- ▶ shaped-pupil: induce dark hole from 3" to 8" around B

Lyot stop

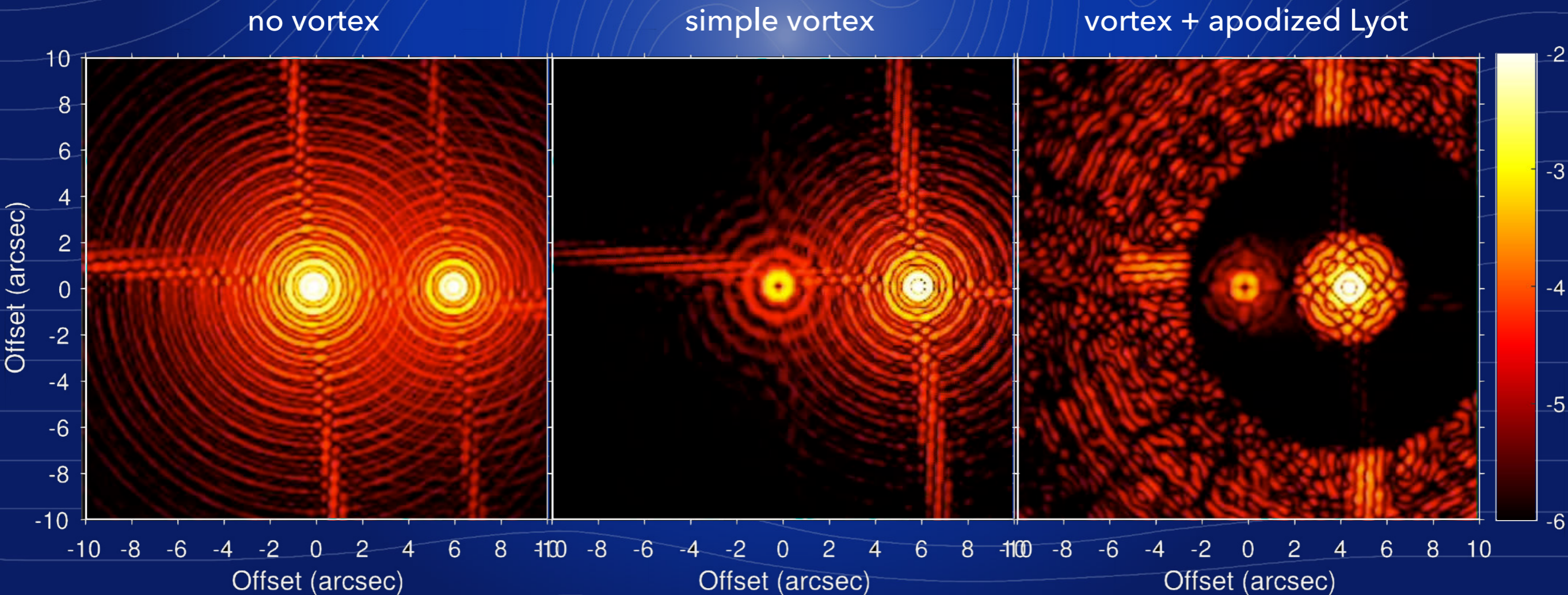


apodized Lyot stop



# NOTIONAL IMAGES OF ALPHA CENTAURI SYSTEM

- ▶ habitable zone at  $0.8'' - 1.1''$  (A) or  $0.5'' - 0.65''$  (B)
- ▶ contrast around  $10^{-6}$  for  $2 R_{\oplus}$  planet



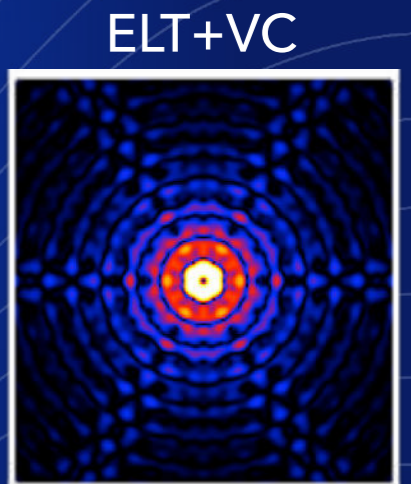
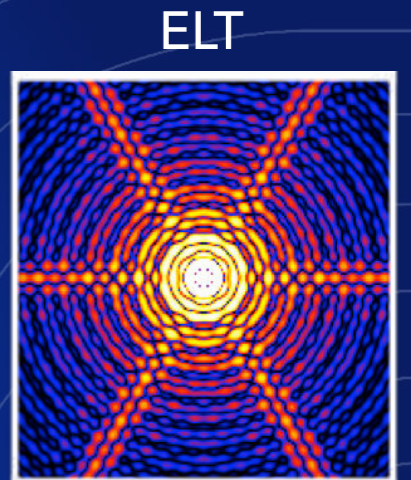
## NEXT STEPS: VLT/ERIS AND ELT/METIS

▶ ERIS: L & M band AGPMs

- \* standard vortex coronagraph with simple Lyot stop

▶ METIS: L, M & N band AGPMs

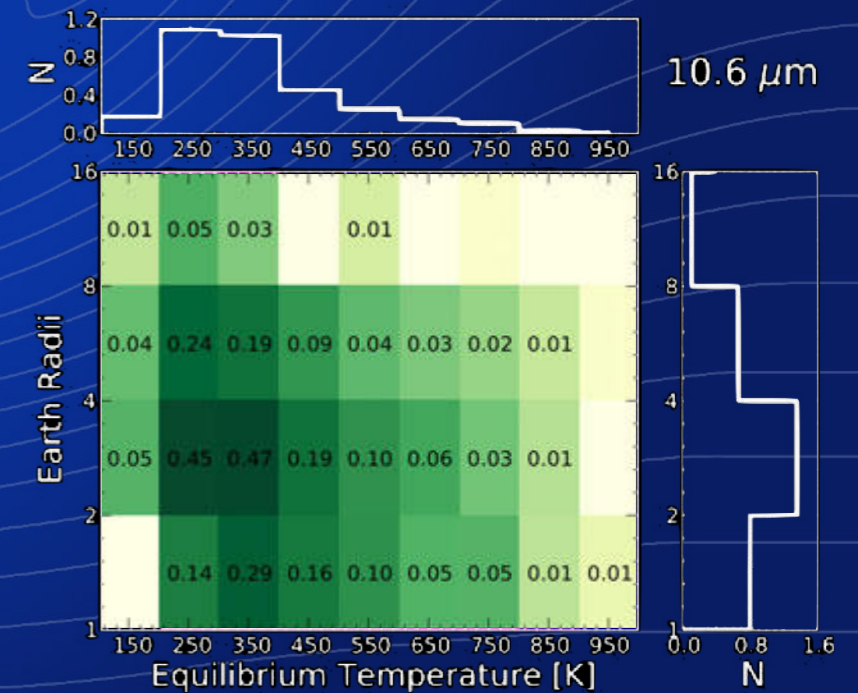
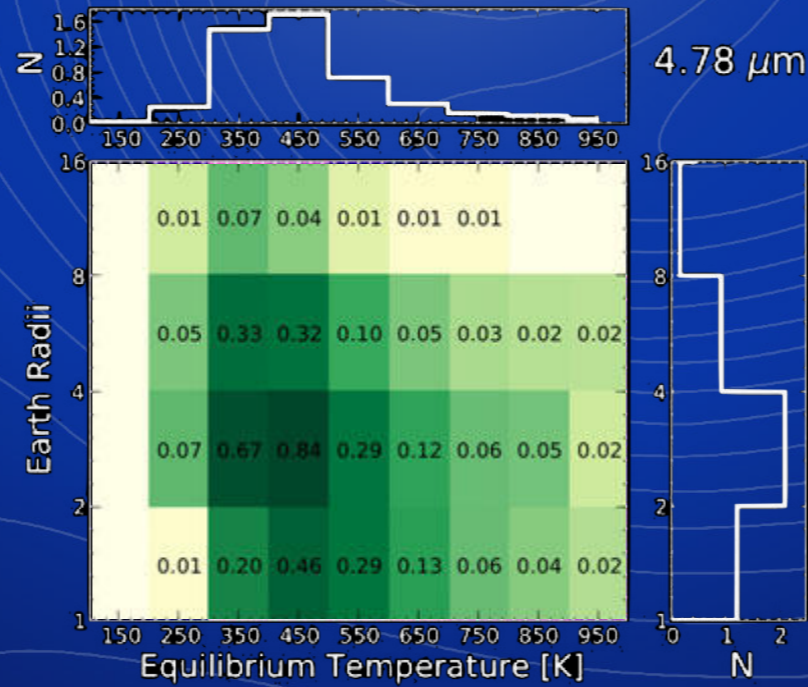
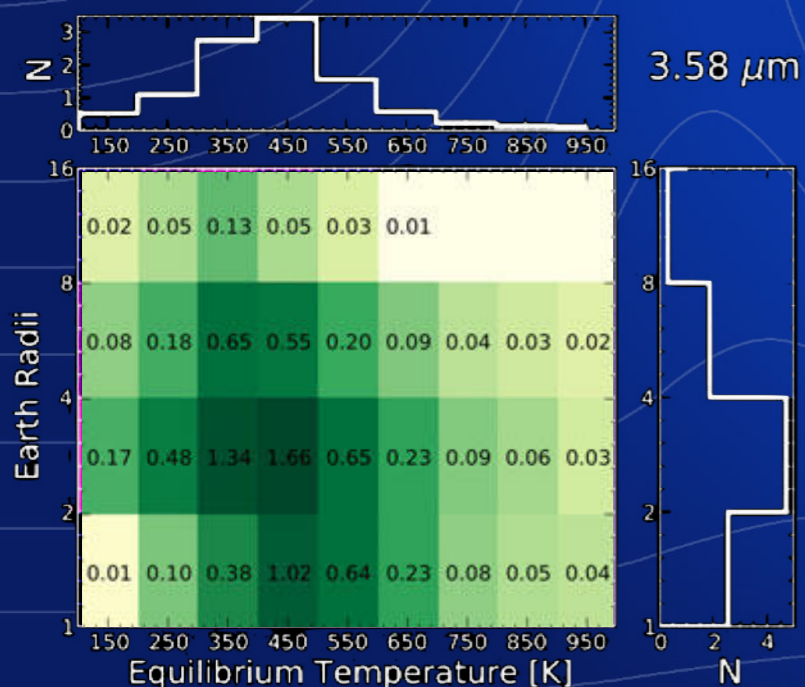
- \* ring-apodized vortex coronagraph: cancels diffraction from huge central obstruction





# METIS SCIENCE HIGHLIGHTS

- ▶ direct imaging of several RV planets
- ▶ potential to detect temperate rocky planets
- ▶ characterization with high-res LM-band IFS



## A VORTEX UPGRADE FOR SPHERE?

- ▶ goal: open the  $1-3 \lambda/D$  parameter space
  - \* increase number of detections
  - \* access a few RV planets
- ▶ need to identify main limitations to FQPM performance
  - \* component degradation?
  - \* effect of dead actuators?
  - \* low-order wavefront aberrations?
- ▶ K-band AGPM performance being evaluated



**THANKS FOR YOUR  
ATTENTION**