

High Contrast Imaging R&D at the Subaru Coronagraphic Extreme Adaptive Optics

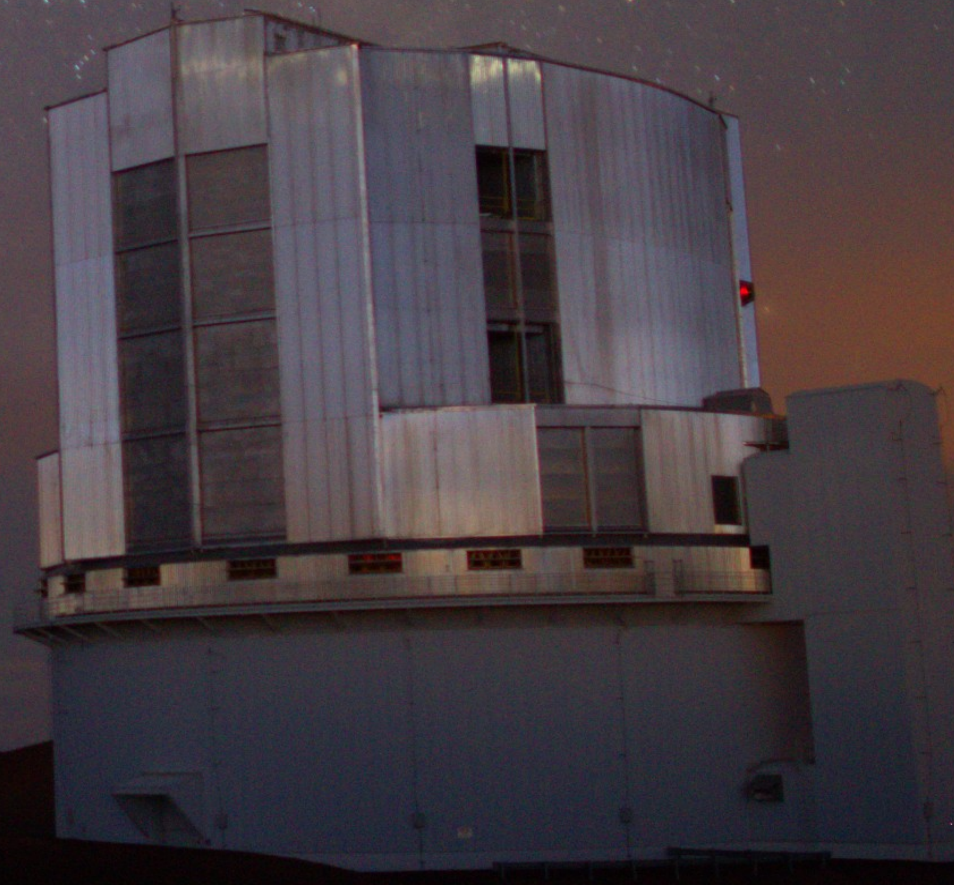
Olivier Guyon

*Subaru Telescope, National Astronomical Observatory of Japan,
National Institutes for Natural Sciences (NINS)*

University of Arizona

Astrobiology Center, National Institutes for Natural Sciences (NINS)

Breakthrough Initiatives team member (Starshot and Watch)



Adaptive Optics (AO)

Atmosphere Turbulence: Earth's atmosphere introduces strong and fast optical aberrations

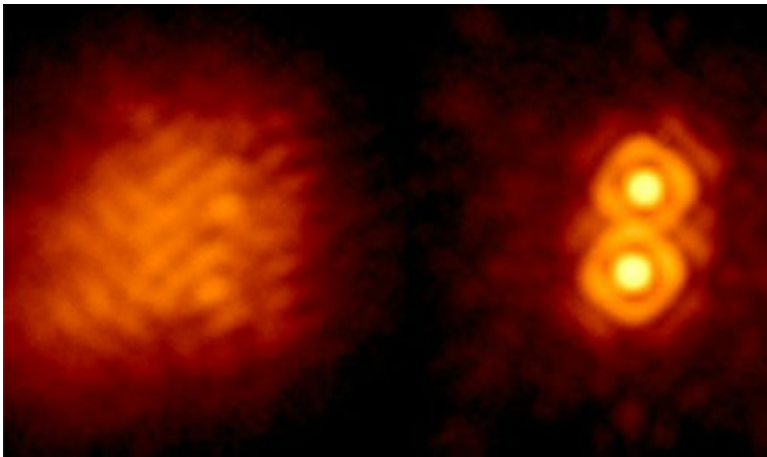
Aberrations must be continuously **measured** and **corrected** to provide sharp images.

Imaging exoplanets is particularly demanding, as the planet is much fainter than the star it orbits: very little room for error !

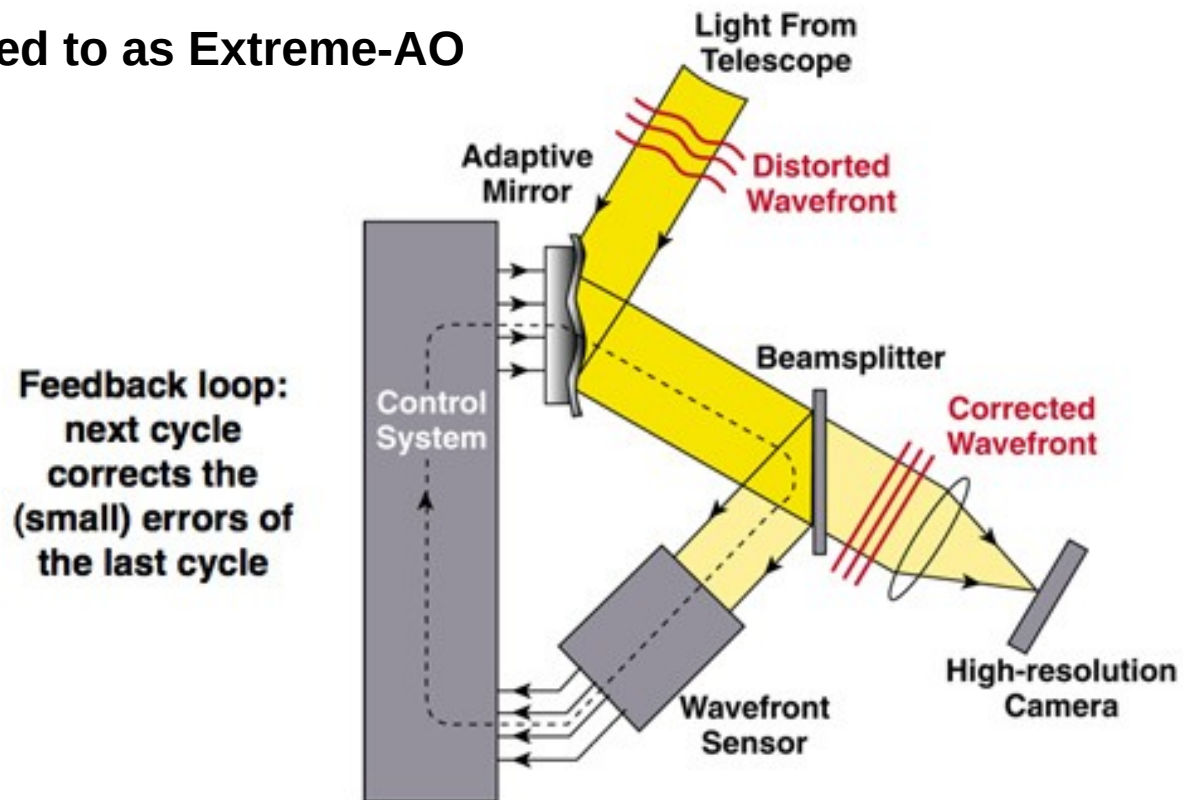
→ **AO for exoplanet imaging is referred to as Extreme-AO**

AO OFF

AO ON



Palomar obs / NASA JPL



Imaging exoplanets requires two techniques to be combined:

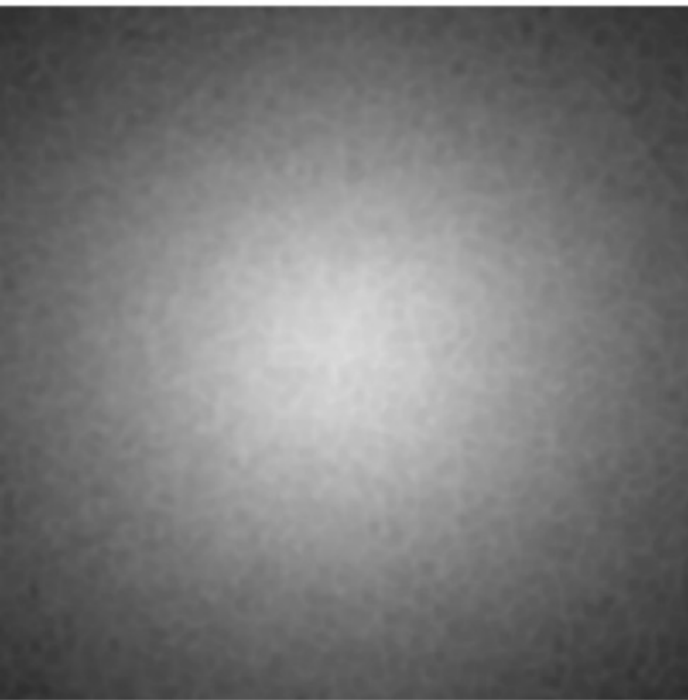
- **Extreme-AO** corrects atmospheric turbulence
- **A coronagraph** masks the light of the bright star

- 1: ExAO control radius
- 2: Telescope spider diffraction
- 3: Diffraction rings
- 4: Ghost spider diffraction
- 5: "butterfly" wind effect
- 6: Coronagraphic leak (low order aberrations)

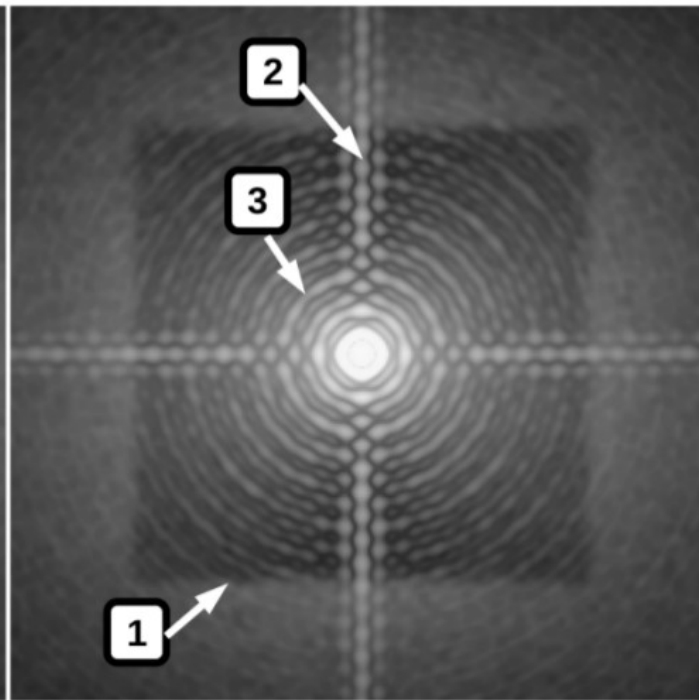
Simulated images below show how Extreme-AO and Coronagraphy deliver high contrast image of a star

Monochromatic PSFs, 1.65 μ m
No photon noise
10m/s wind speed, single layer
4ms wavefront control lag

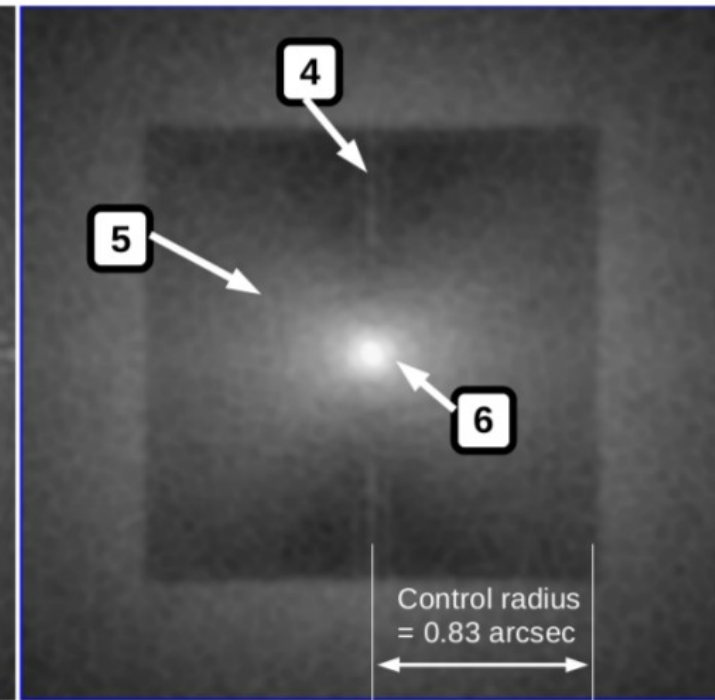
No AO correction



Extreme-AO correction



Extreme-AO + coronagraph



-4.7

-4.4

-4.1

-3.8

-3.5

-3.2

Contrast (10-base log)

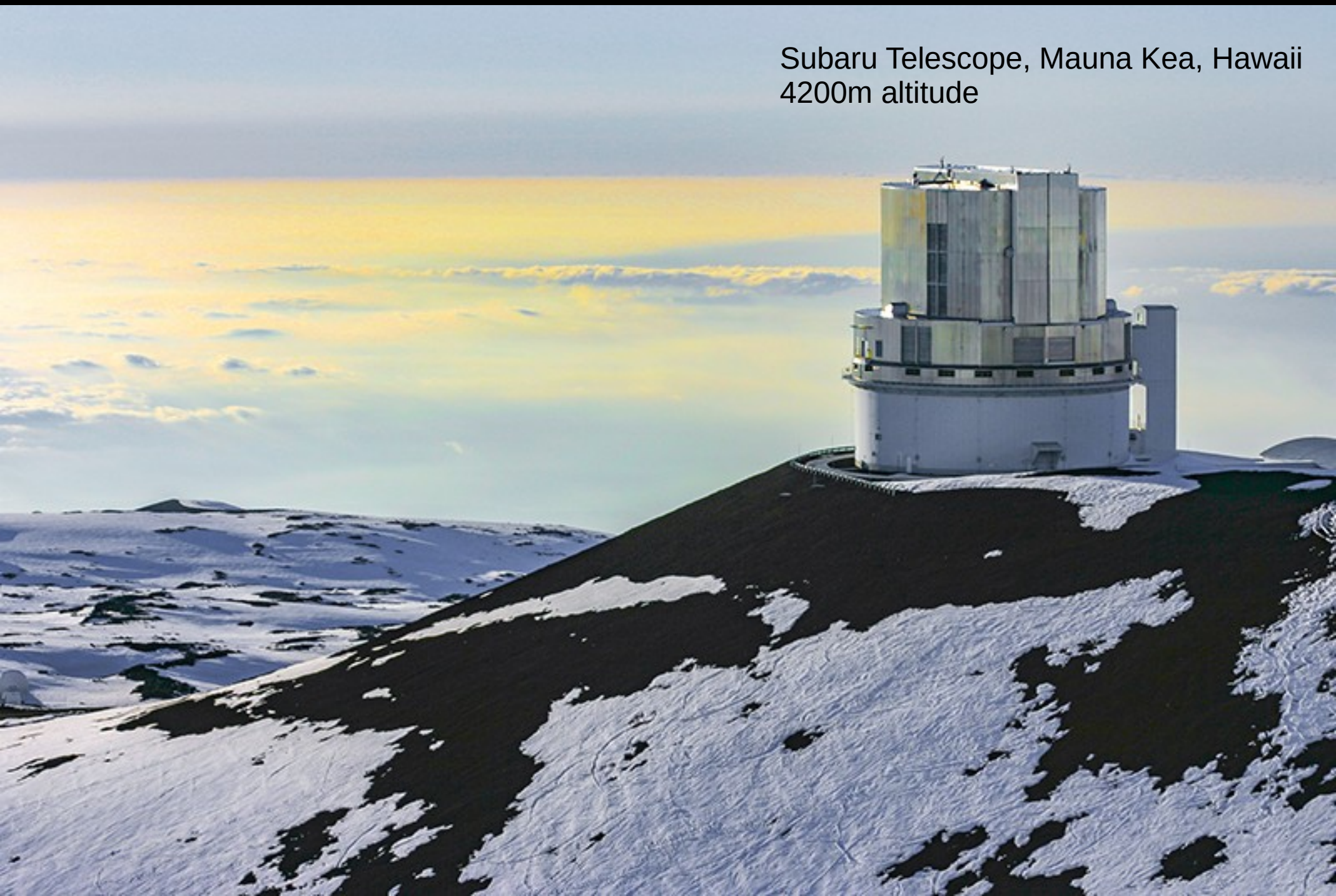
-2.9

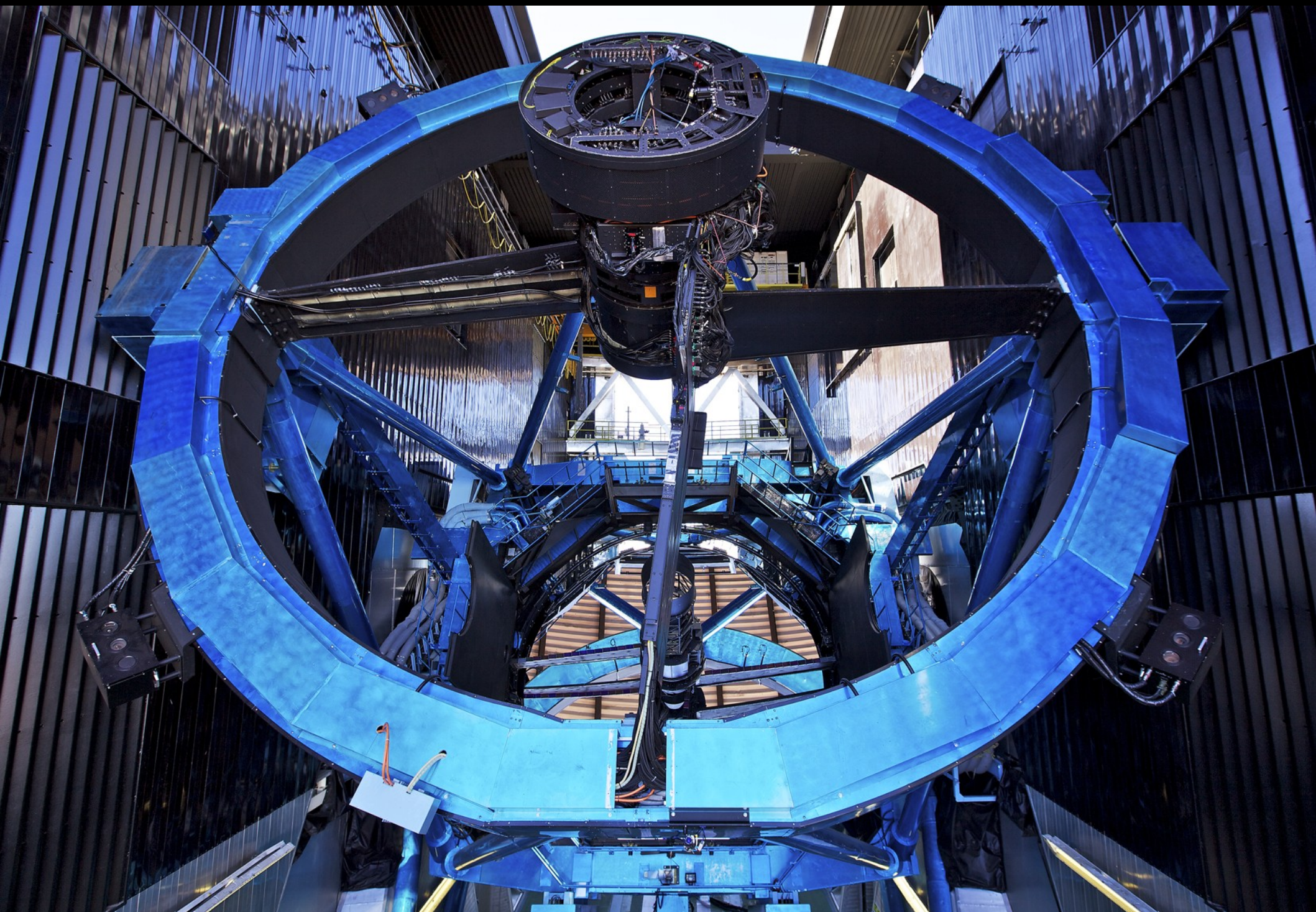
-2.6

-2.3

Subaru Telescope (8.2m diameter) has an exoplanet-imaging instrument (SCEXAO)
The instrument team is developing advanced Extreme-AO techniques

Subaru Telescope, Mauna Kea, Hawaii
4200m altitude





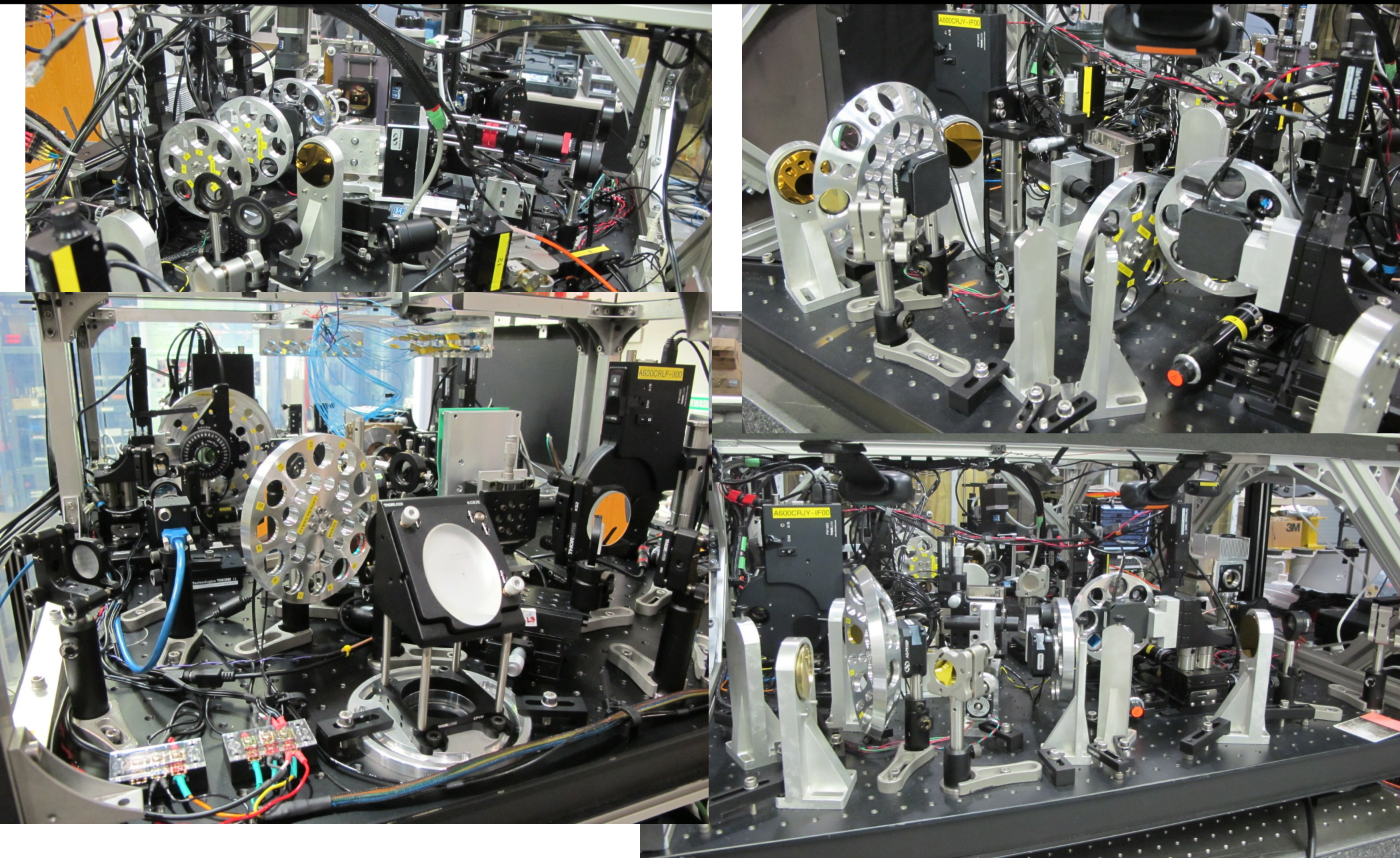
Subaru Telescope (view from inside dome)

Photograph by Enrico Sachetti

SCEXAO Subaru Coronagraphic Extreme Adaptive Optics

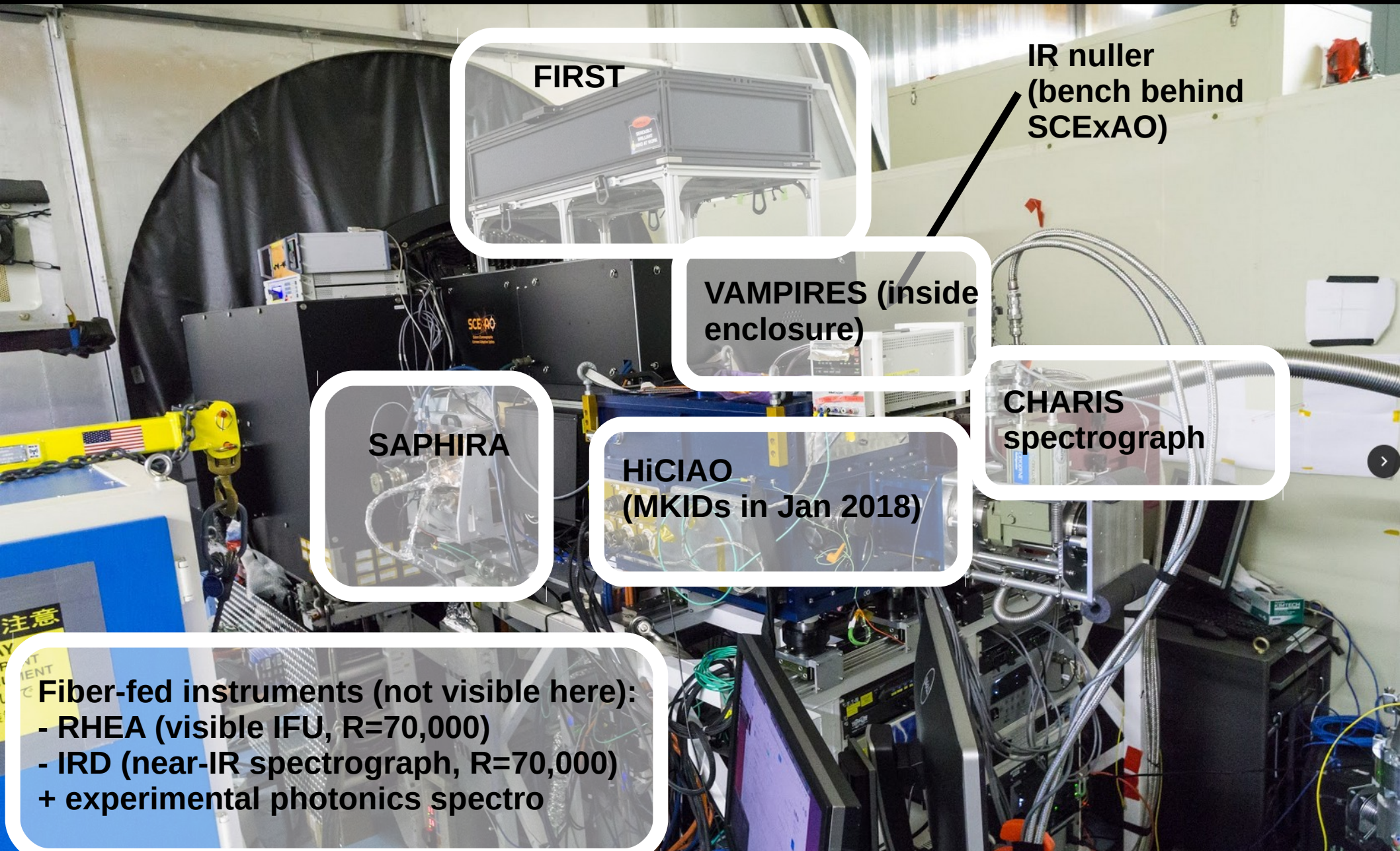


SCEXAO Subaru Coronagraphic Extreme Adaptive Optics





Subaru Coronagraphic Extreme Adaptive Optics



FIRST

IR nuller
(bench behind
SCEXAO)

VAMPIRES (inside
enclosure)

SAPHIRA

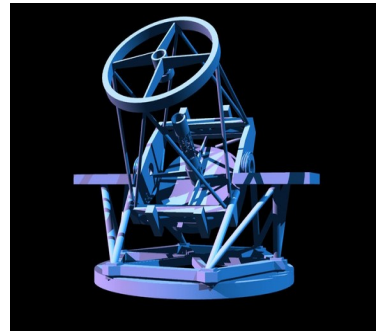
HiCIAO
(MKIDs in Jan 2018)

CHARIS
spectrograph

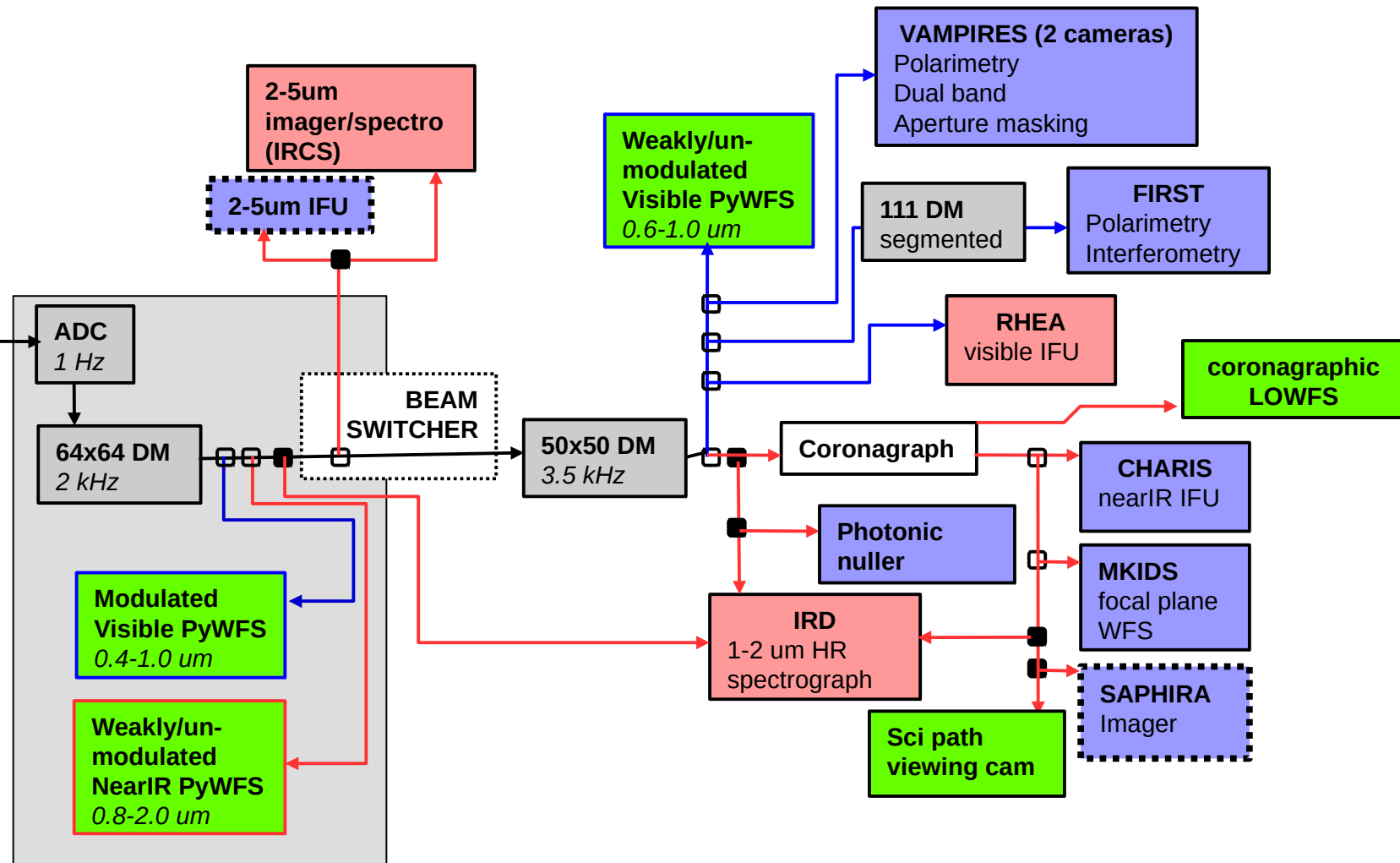
Fiber-fed instruments (not visible here):

- RHEA (visible IFU, $R=70,000$)
- IRD (near-IR spectrograph, $R=70,000$)
- + experimental photonics spectro

SCExAO Light path



Facility AO



Active WF correction

Dedicated science instrument

Mixed science/WFS

Dedicated WFS

Visitor port

□ dichroic

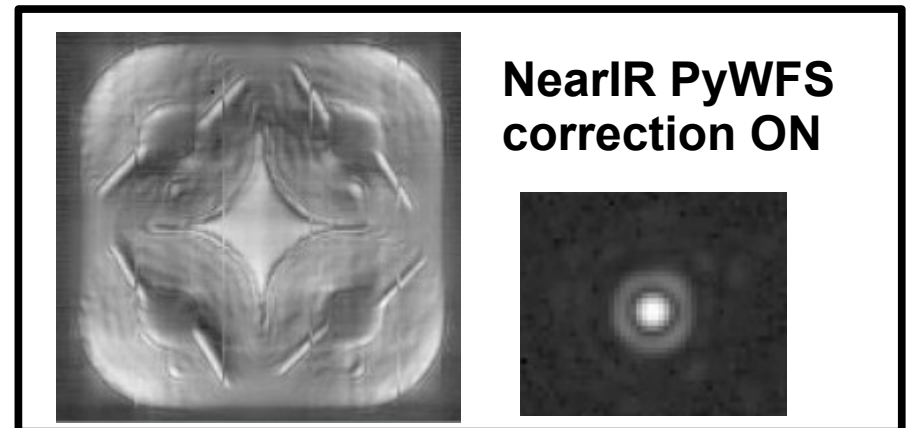
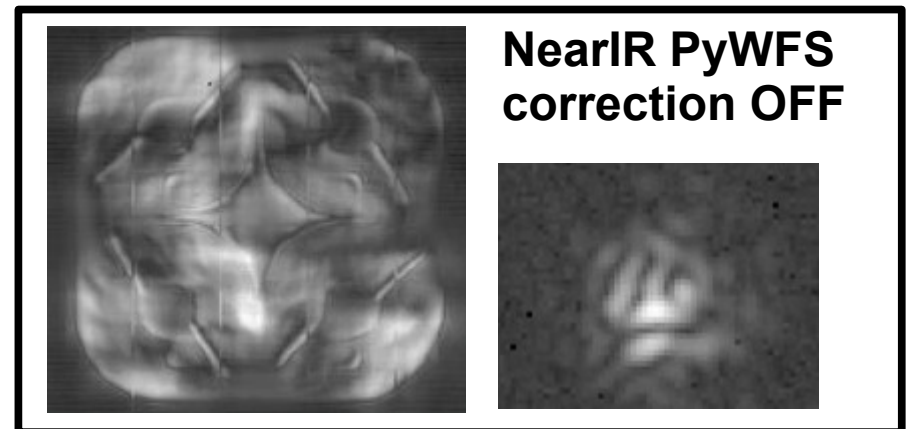
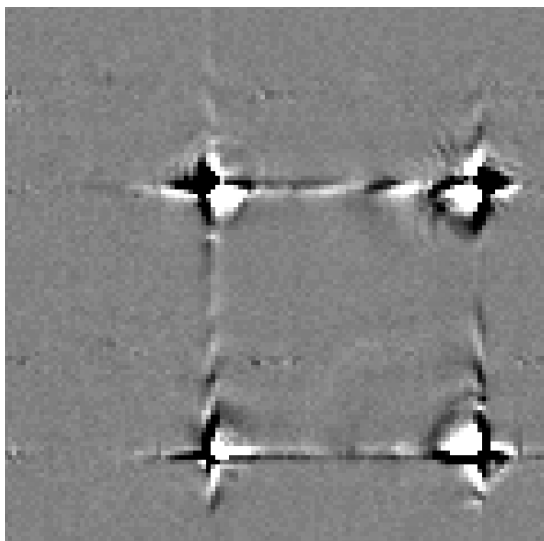
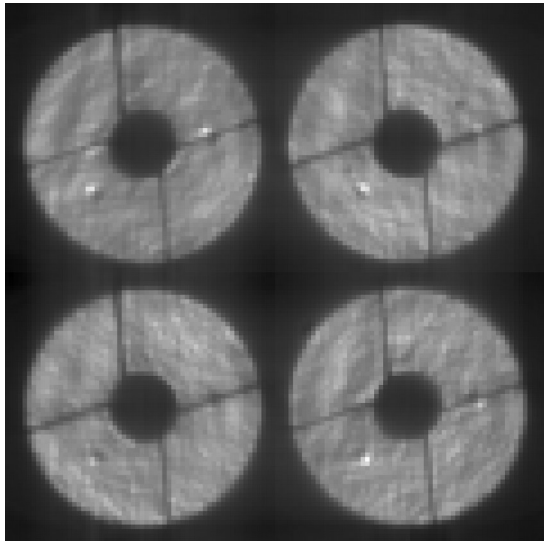
■ beam switch

11 wavefront sensors

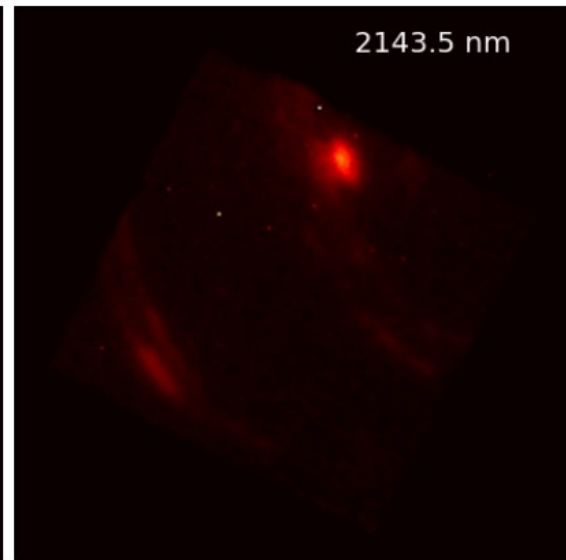
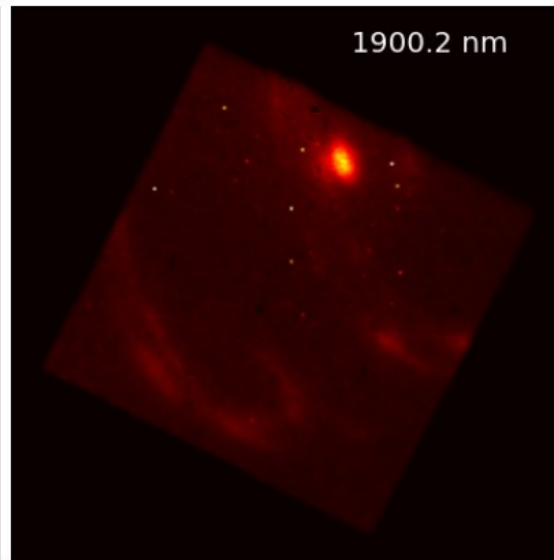
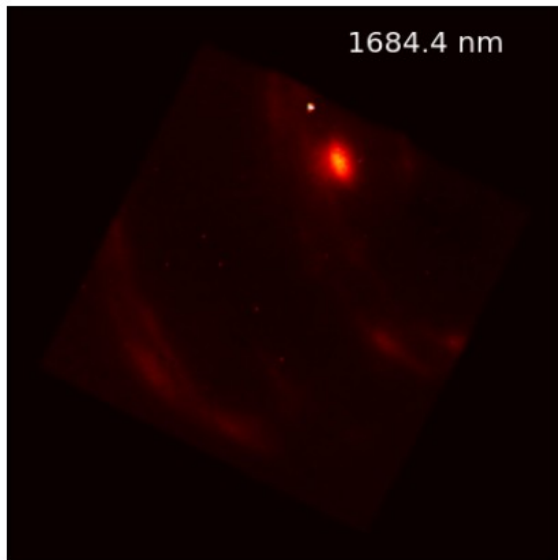
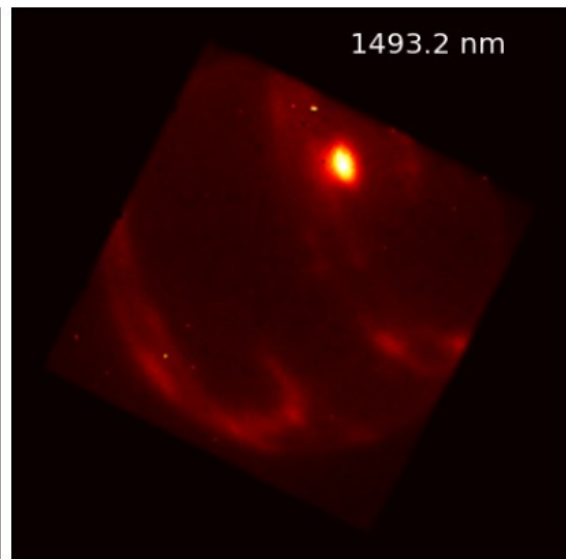
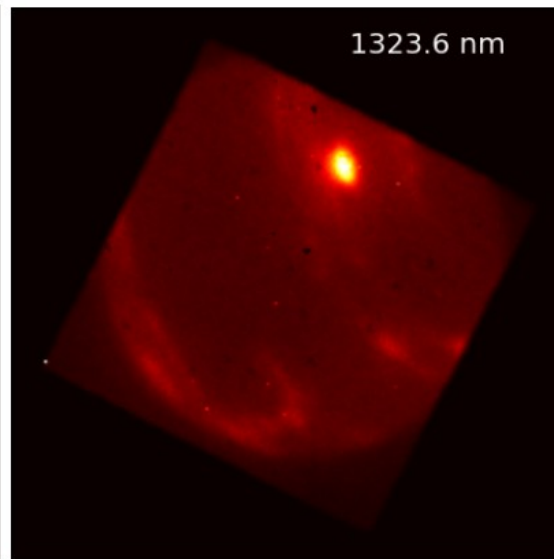
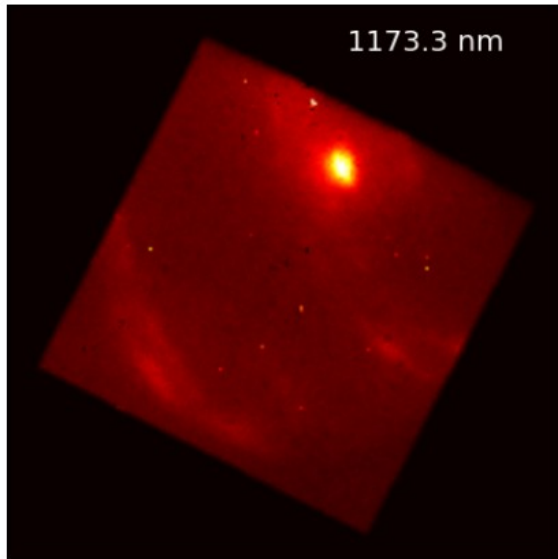
High performance WFS

Low-modulation PyWFS (600-900nm)
14400 sensors → 2000 actuators
loop runs at up to 3.5 kHz

Unmodulated PyWFS demo (H band, SAPHIRA)
14400 sensors → 2000 actuators



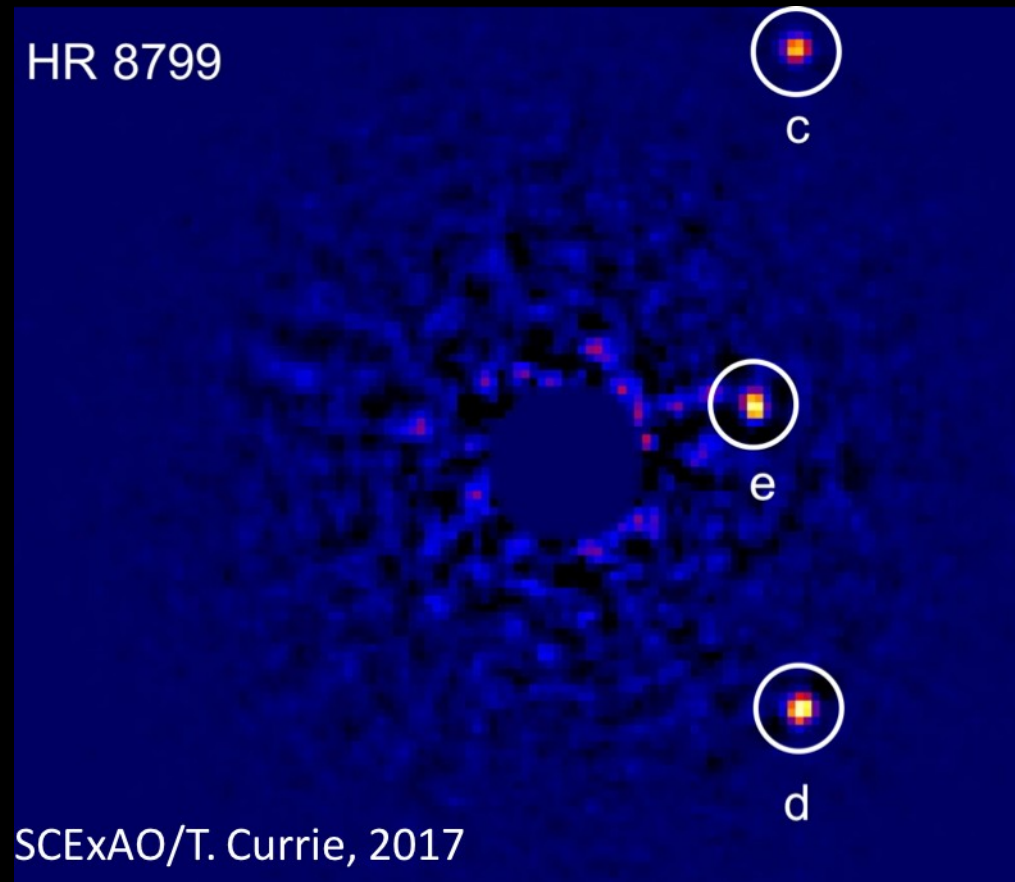
Neptune imaged with SCExAO doesn't fit in field of view ! (using CHARIS camera)



HR8799

Four planets, orbital periods on the order of 100yr
Each planet 5 to 7 Jupiter Mass

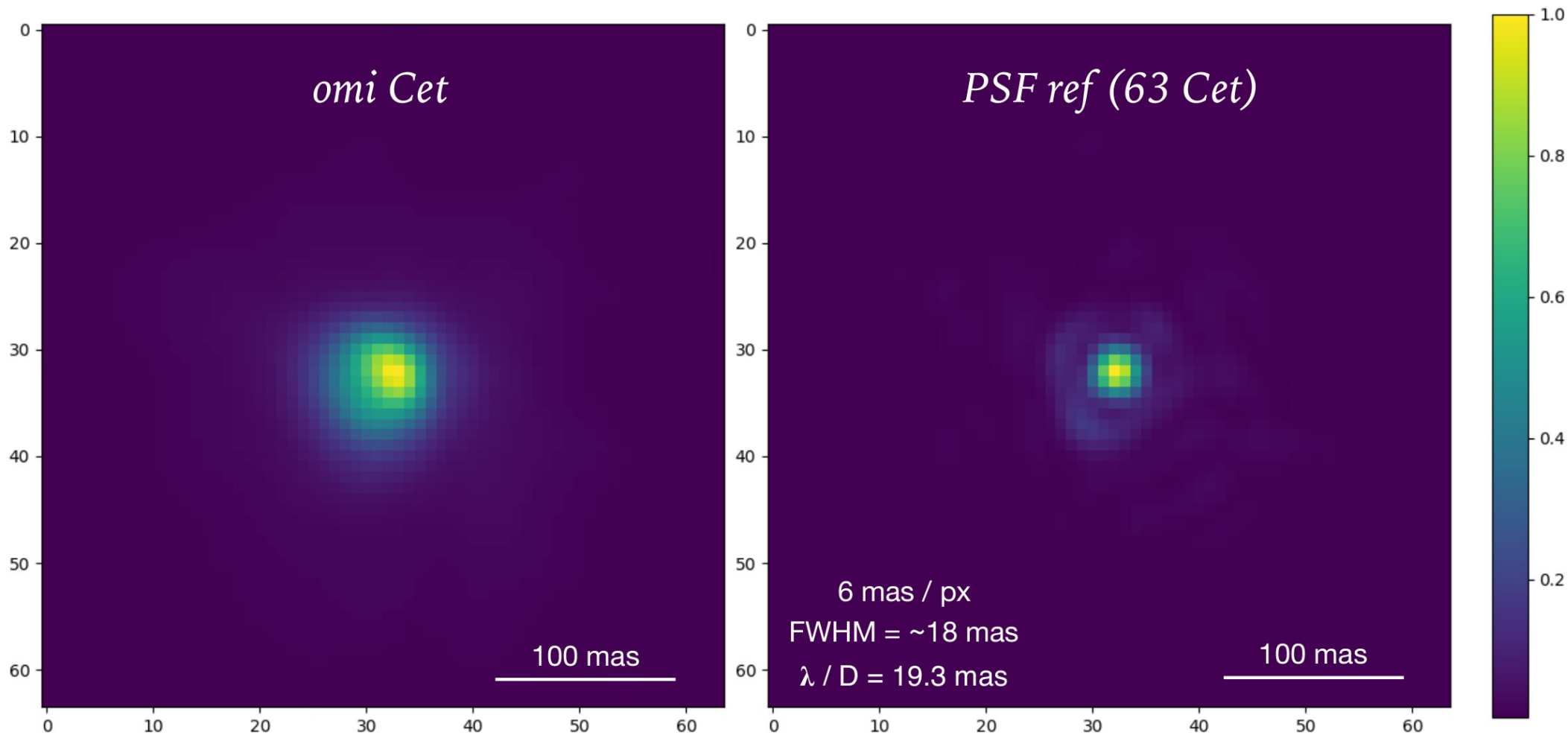
Subaru Telescope/ SCEExAO (Currie et. al 2017)



VAMPIRES Update Feb 2018

Key improvement 2017-18: Full Pupil speckle-imaging / PDI mode

- Direct imaging of Mira-variable star *omi Cet* - clear asymmetry seen.
- Speckle imaging - diffraction-limited



Preliminary VAMPIRES science

Circumstellar dust around Red Supergiant μ Cephei

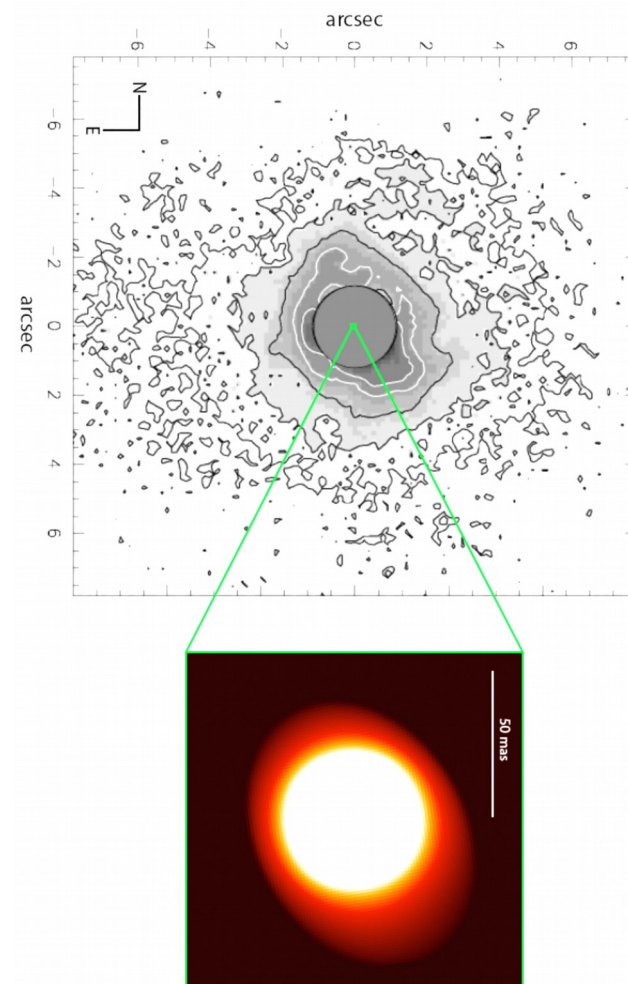
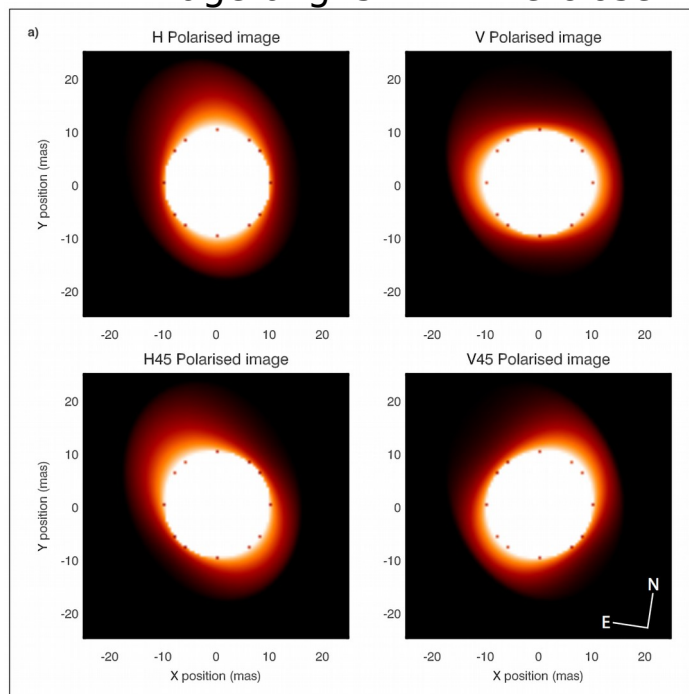
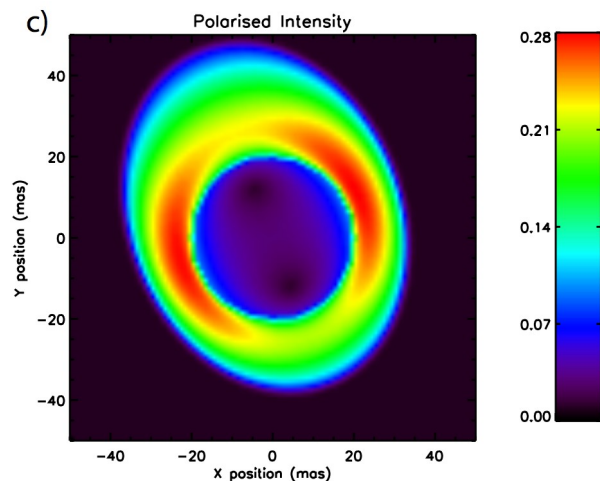
Model-fitting reveals extended, asymmetric dust shell, originating within the outer stellar atmosphere, without a visible cavity. Such low-altitude dust (likely Al_2O_3) important for unexplained extension of RSG atmospheres.

Inner radius: 9.3 ± 0.2 mas (which is roughly R_{star})

Scattered-light fraction: 0.081 ± 0.002

PA of major axis: $28 \pm 3.7^\circ$ • Aspect ratio: 1.24 ± 0.03

Left: model image, shown in polarized intensity. **Middle:** model image show in four polarisations. **Right:** Model image (intensity), shown with wide field MIR image (from de Wit et al. 2008 – green box shows relative scales. Axis of extension in MIR image aligns with the close-in VAMPIRES image.



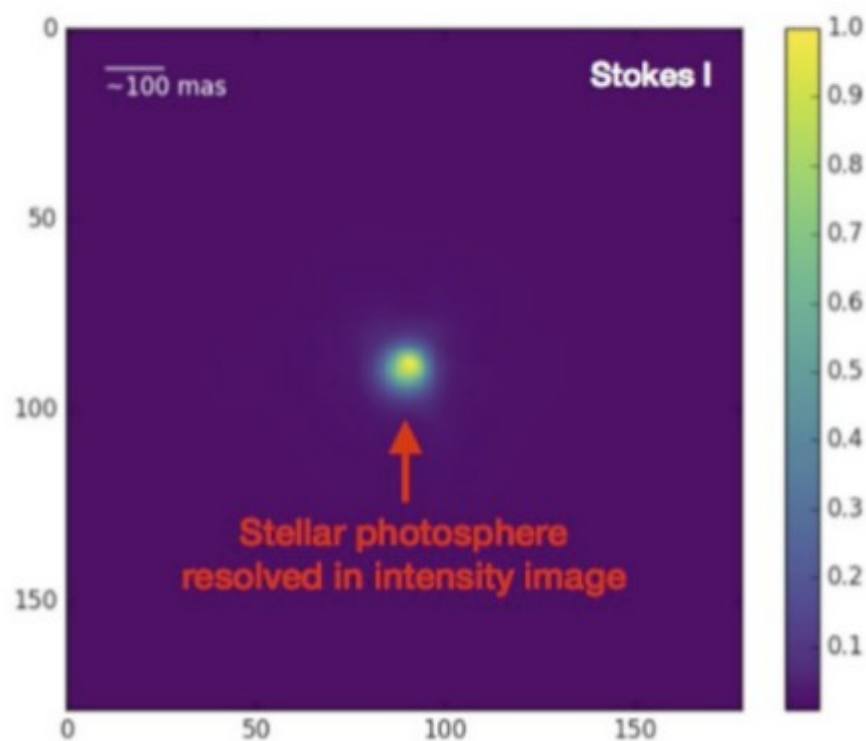
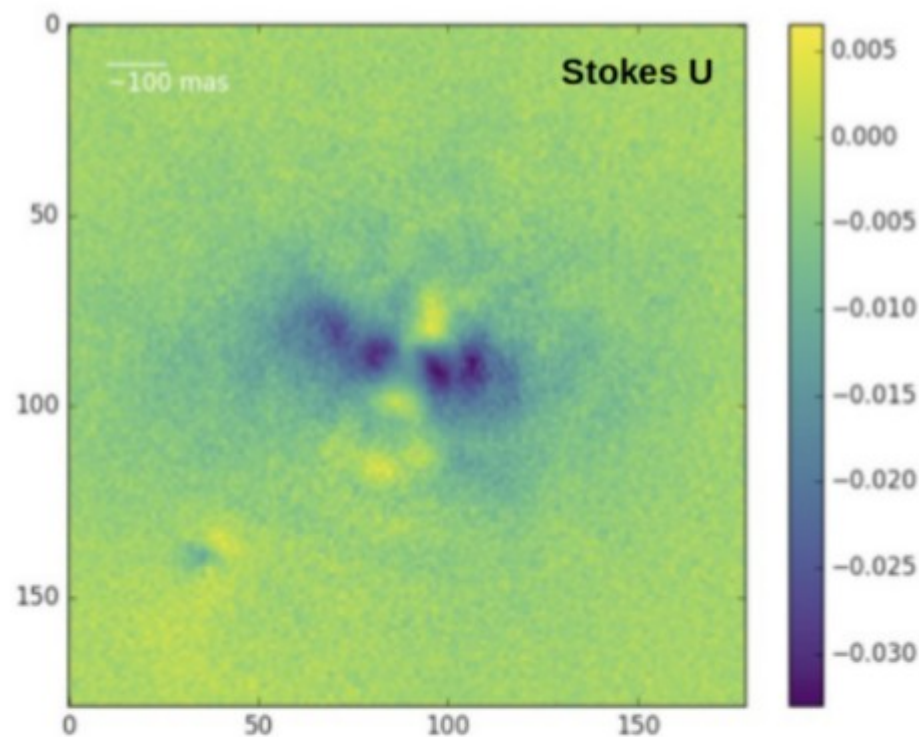
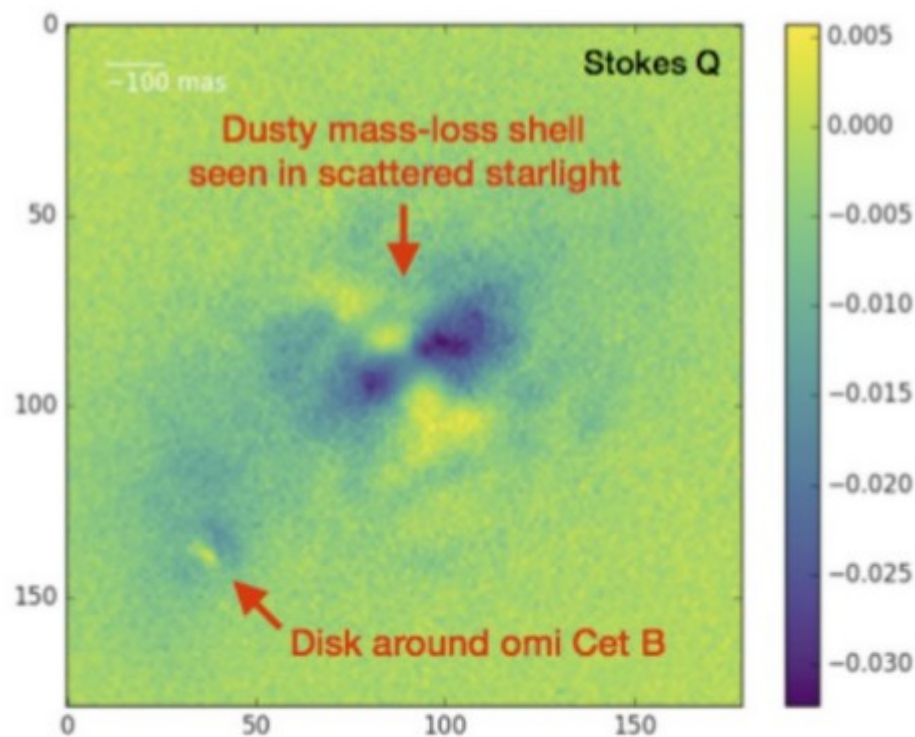


Figure 4: Omi Ceti (Mira) polarimetric imaging
Fractional stokes Q (upper left), U (upper right) and I (lower left) images of *omi* Cet and the surrounding mass-loss shell, taken at 750 nm with VAMPIRES. In the polarisation images the mass-loss shell and associated nebulosity is clearly seen, as well as the circumstellar disk around its companion *omi* Cet B. Understanding the mass-loss process relies on properly constraining dust grain size distributions and species (at separate spatially resolved points). This requires observations across a wide set of wavelengths, including Y, J and H band, in addition to R and I as probed by VAMPIRES.

VAMPIRES Update Feb 2018

H α SDI mode implemented with 1st on-sky tests complete

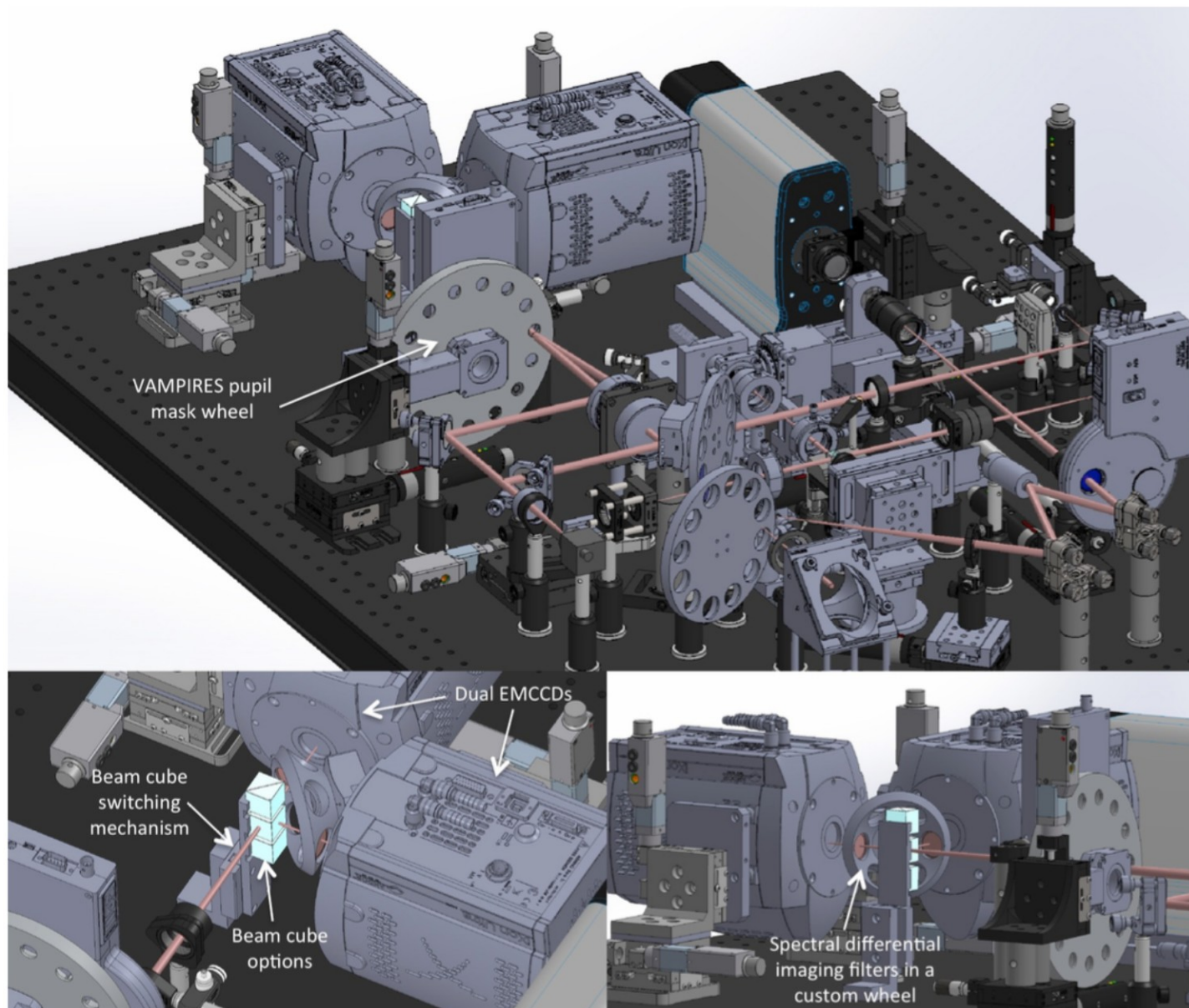


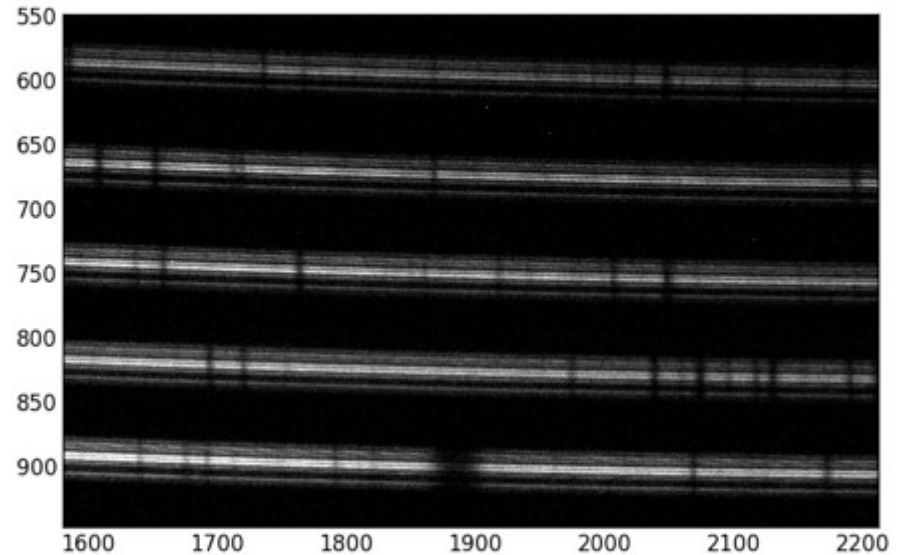
Figure 4: (Top) A view of the entire visible bench of SCExAO. (Bottom left) A zoomed in view of the beam cube switching mechanism. (Bottom right) A zoomed in view of the wheel to switch the filters for differential imaging mode.

Ongoing research / future opportunities

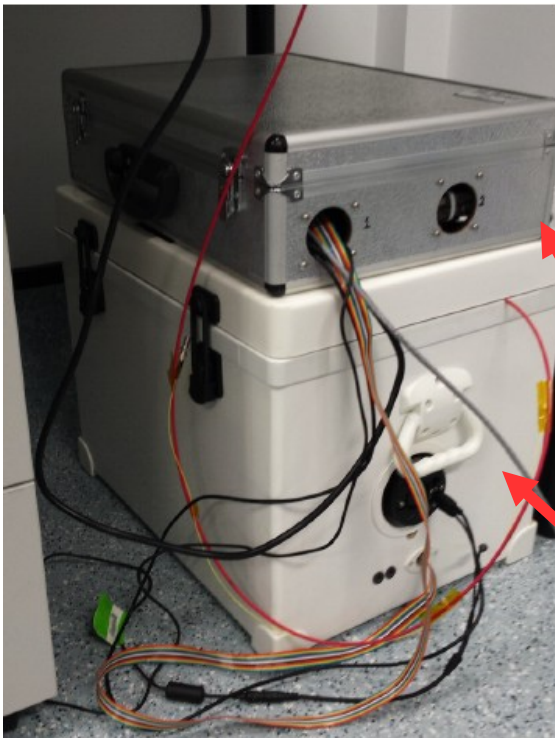
RHEA: Replicable High-resolution Exoplanet & Asteroseismology (PI: Michael Ireland, ANU)

The main specifications of RHEA@Subaru are:

Spatial Resolution	8 milli-arcsec
Spectral Resolution	$R \sim 60,000$
Total Field of View	~ 4 arcsec
Instantaneous Field of View	40 milli-arcsec
IFU Elements	9 (with dithering capability)
Spectrograph Total Efficiency	40%
Injection Unit Efficiency	$\text{Strehl} \times 0.6$



RHEA first light @ Subaru: Eps Vir (detail)
Feb 2016



RHEA electronics

RHEA spectrograph optics + detector

SCExAO feeding IRD

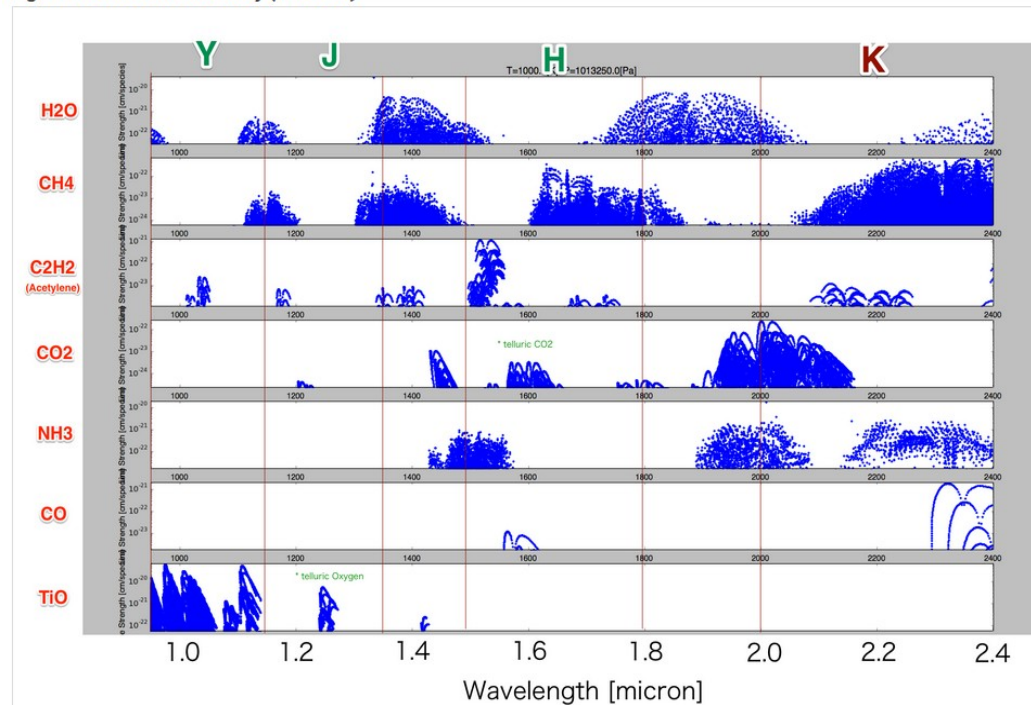
Jovanovic, Kawahara, Kotani, Guyon

- H-band is most useful for self-luminous planets.
- J-band is less useful for the self-luminous one although it's very important for habitable planets.
- Y-band exhibits worse contrast in general, and it's just important for UV absorbers (TiO & VO) in hot planets (>2000K).

Table 1. Important molecules in Y, J, and, H bands

band	molecules
y	TiO, VO, FeH, H ₂ O
J	CH ₄ (weak), H ₂ O, FeH, Fe(5-6 lines), K(4 lines), Na(2 lines)
H	CH ₄ , C ₂ H ₂ , CO ₂ , NH ₃ , CO(weak), H ₂ O, FeH

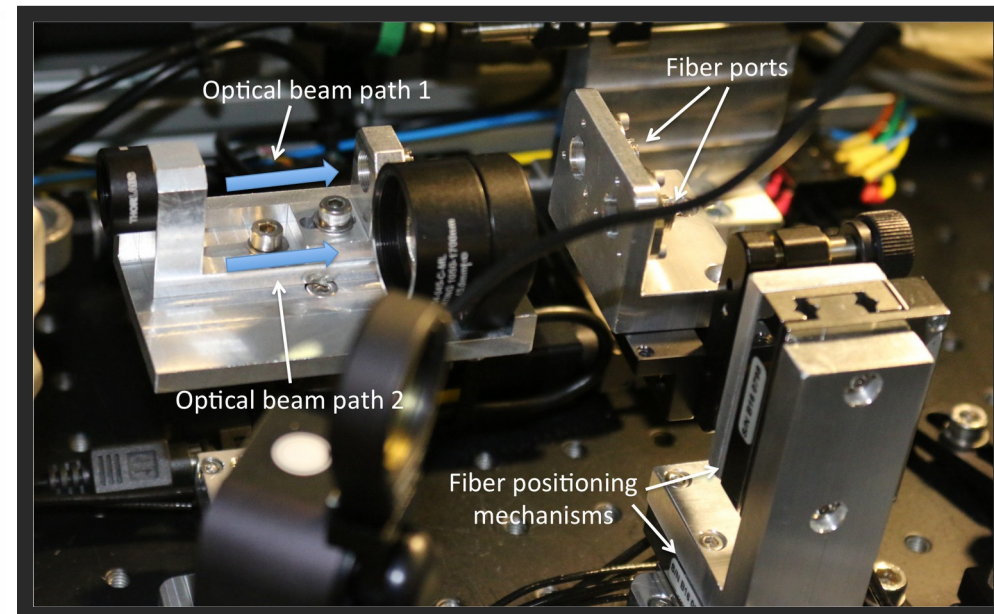
Figure 1. HITRAN Line Intensity (T=1000K)



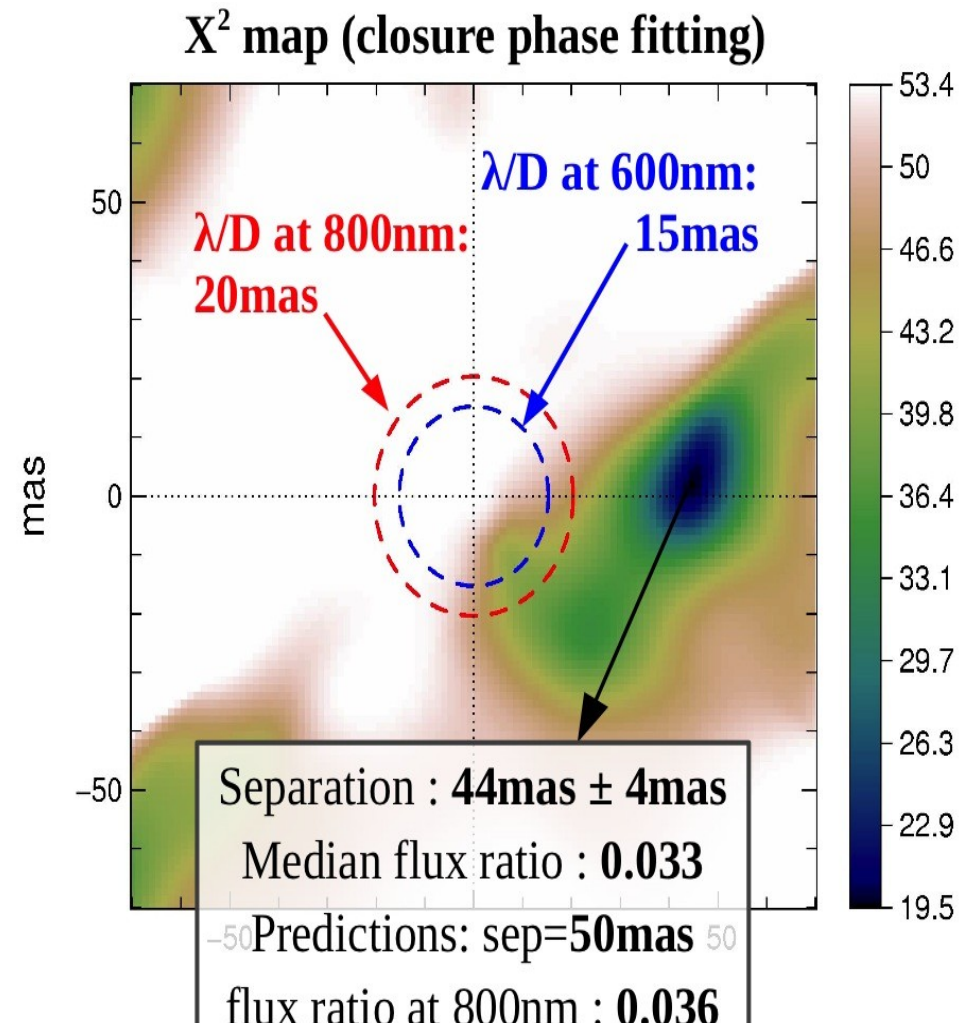
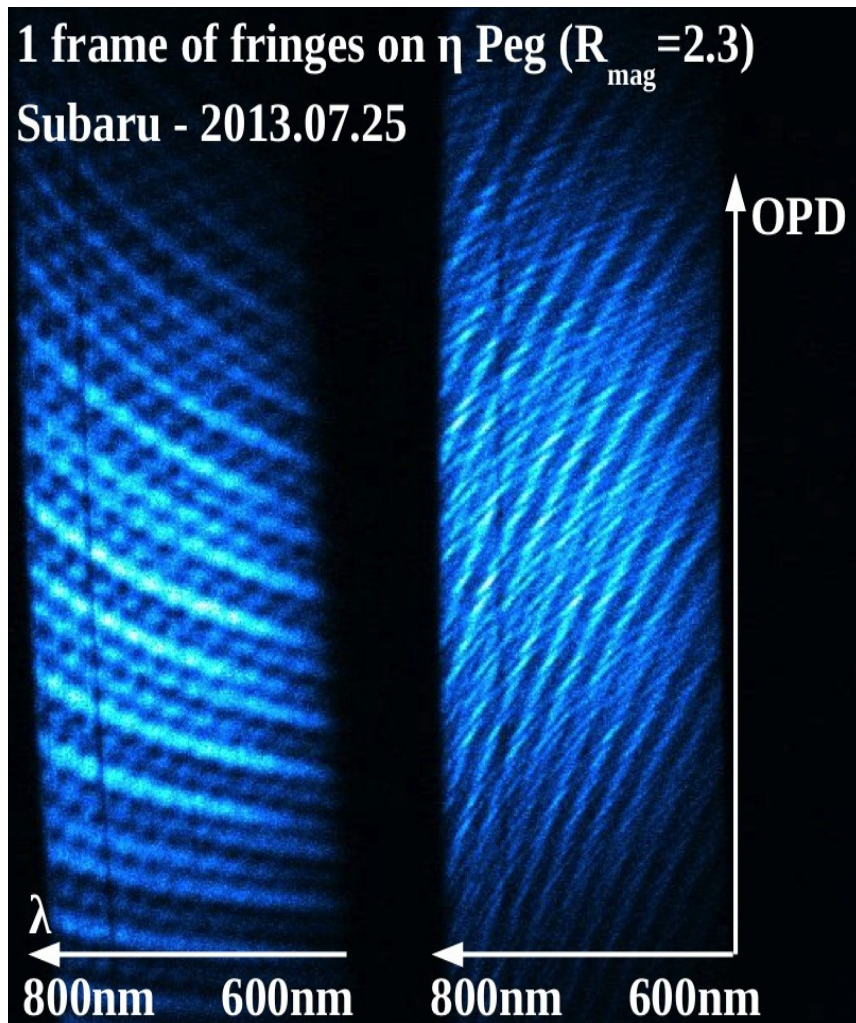
Simultaneous spectroscopy of planet and background speckles

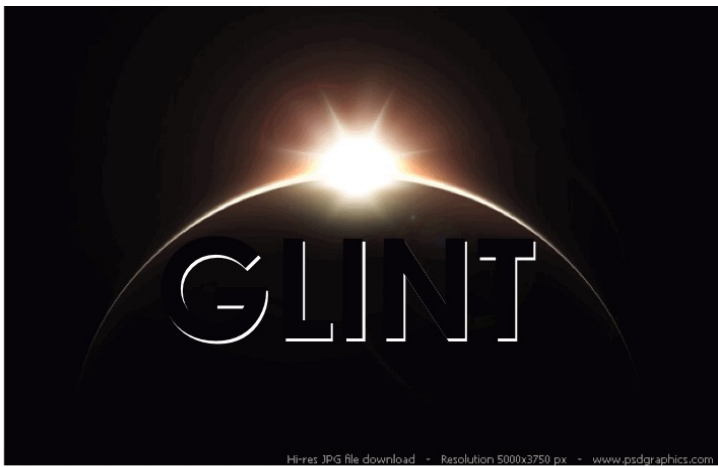
Spectroscopic characterization of exoplanets

Exoplanet search using high spectral resolution signatures as differential signal



FIRST visible light interferometer (stellar physics mostly)





GLINT: Guided Light Interferometric Nulling Technology (funded - PI: Tuthill)

Near-IR photonic nuller chip

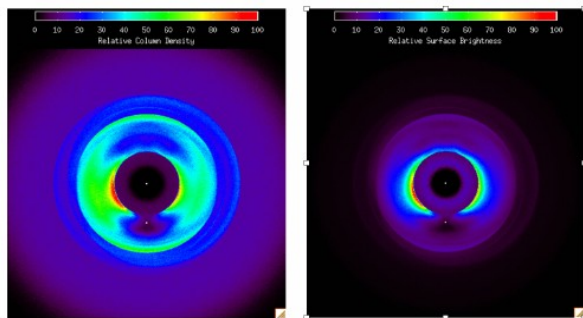


Figure 1: Dust density (Left panel) and simulated $10\ \mu\text{m}$ near-IR image (Right panel) for an exozodiacal disk containing a 5 Earth-mass planet in a 1 AU orbit^{XXStark}. Shepherding of the dust by orbital resonances is clearly visible, and presents a significantly more prominent marker to a remote observer than the planet itself.

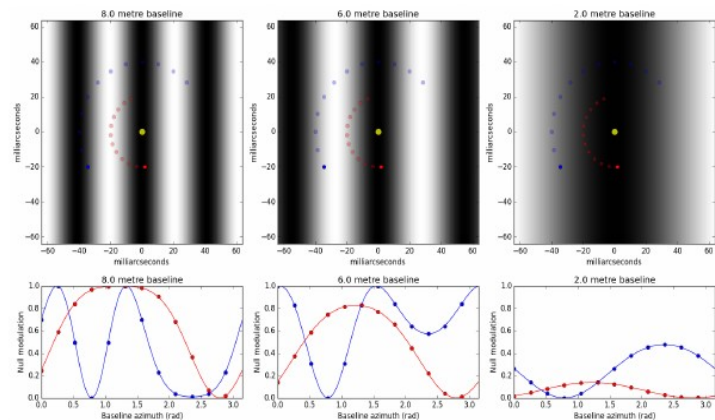
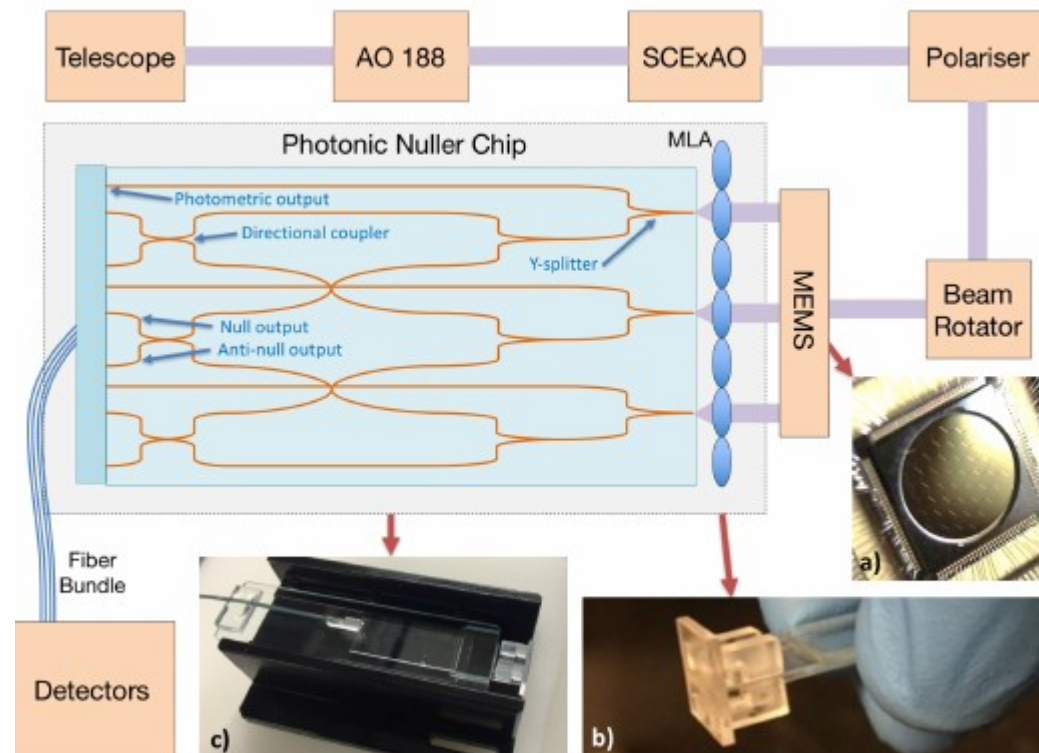


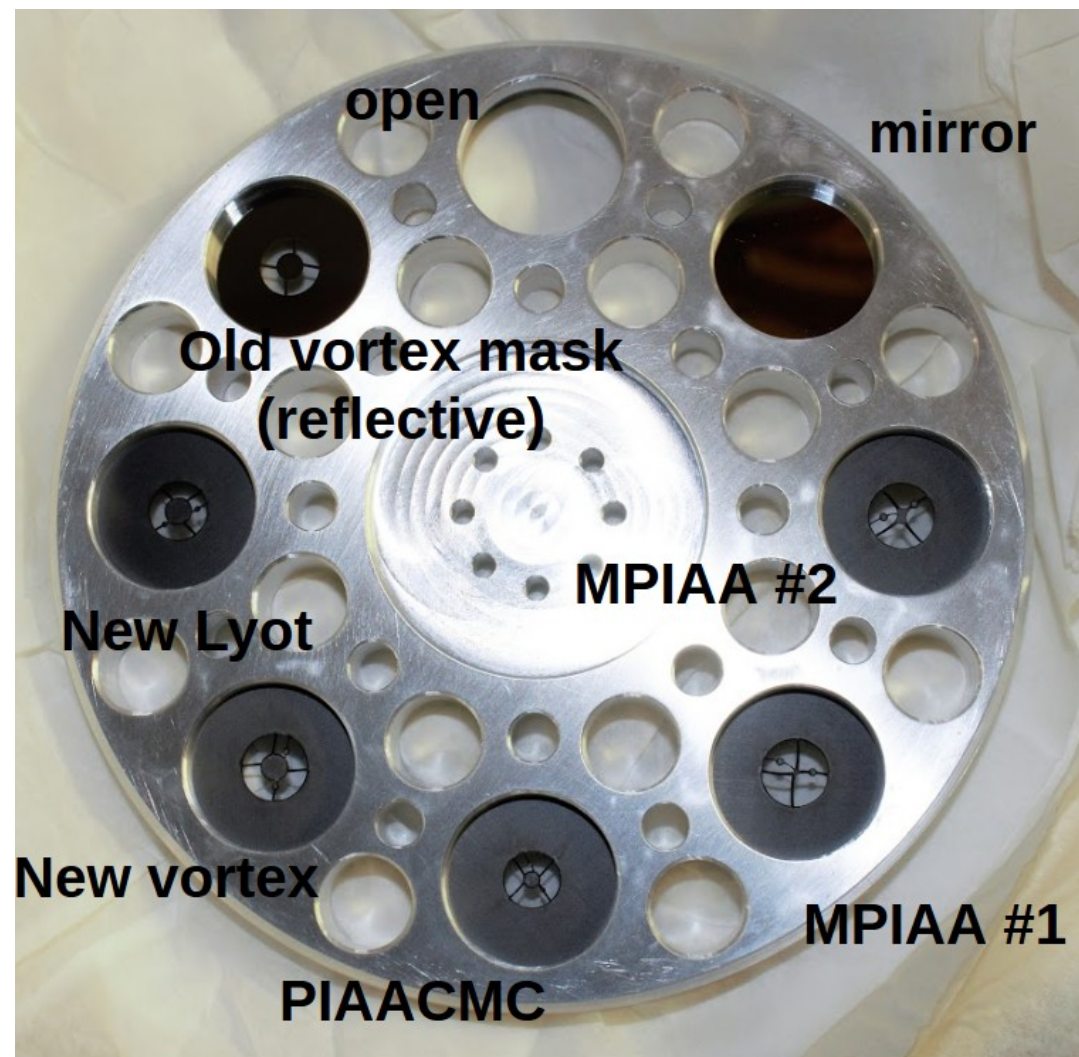
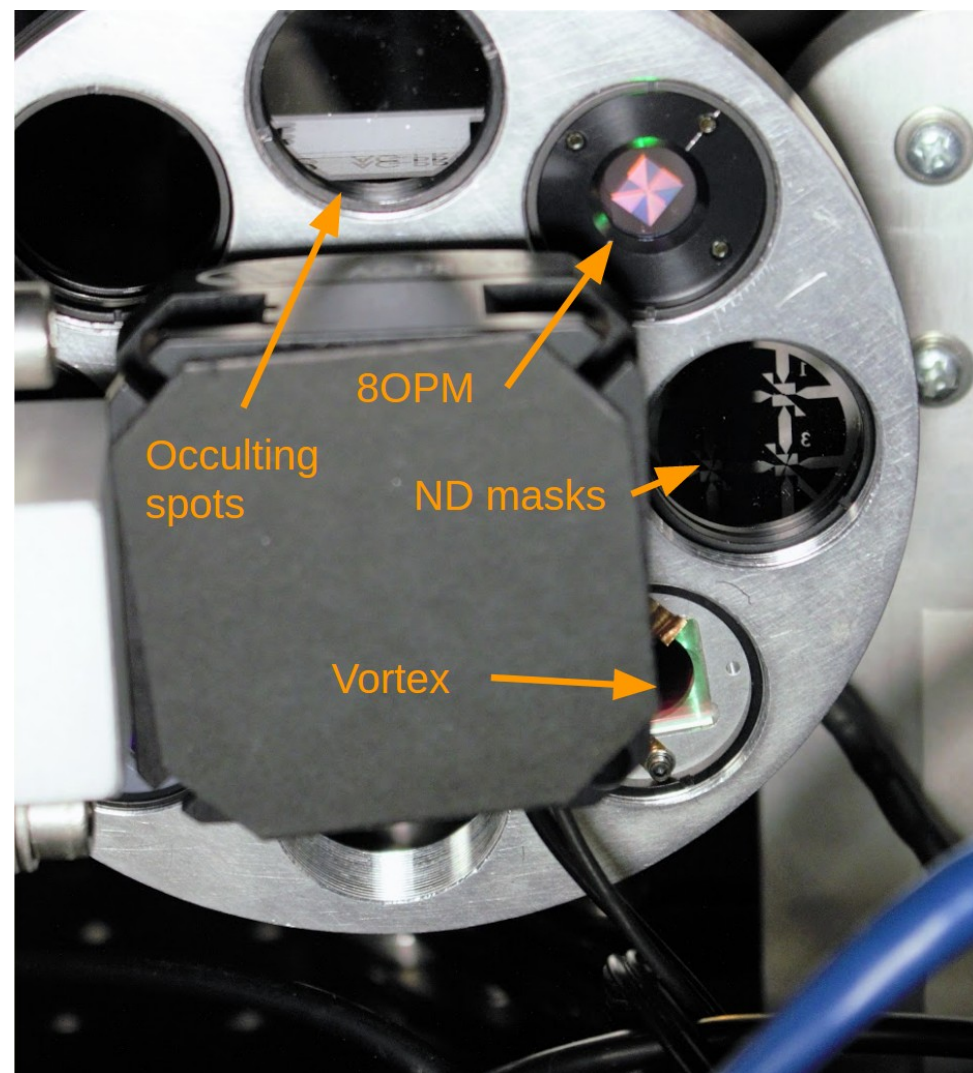
Figure 2: Upper Panels illustrate a star (yellow dot) lying centered within the pattern of a 2-beam nuller where its light is suppressed, while hypothetical planets (red, blue) traverse the interferometer fringes as the instrument is rotated. Lower Panels show the resultant planetary transmission signals produced at the output.

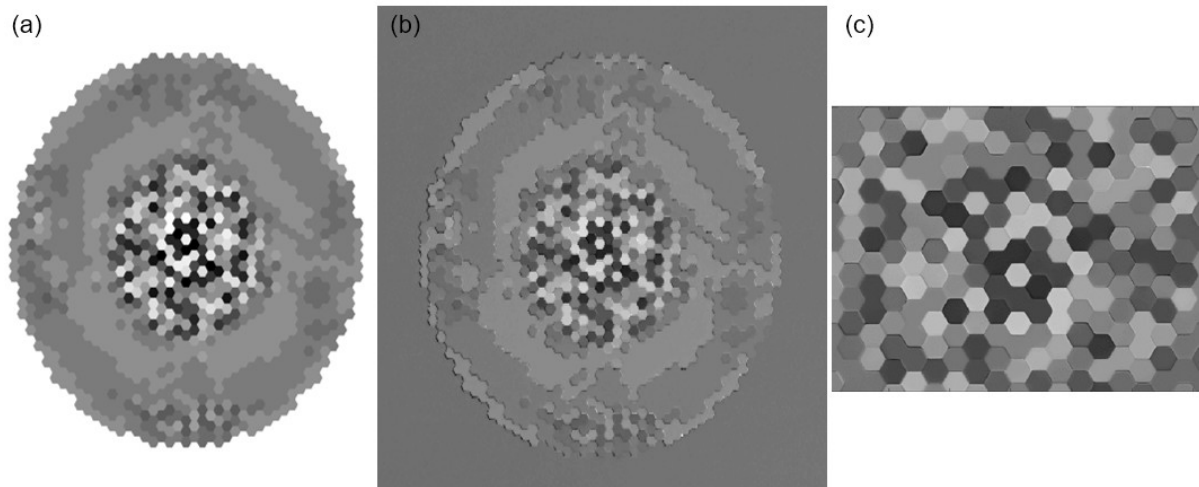


Coronagraphy

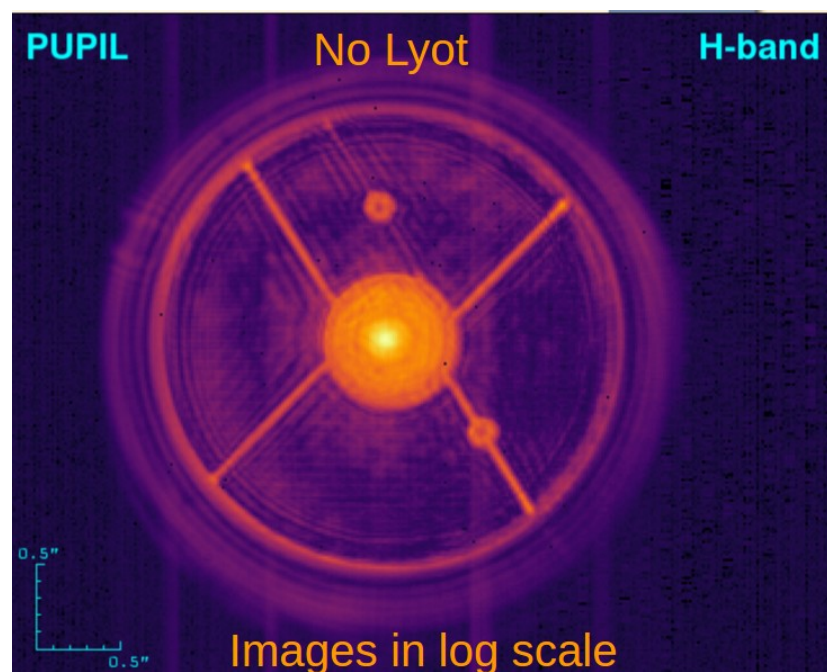
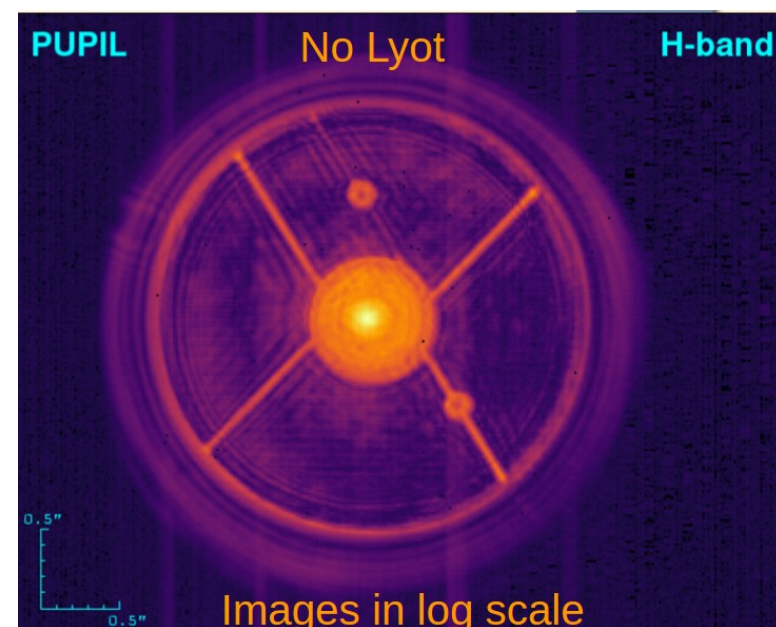
Coronagraphs:

- Vortex
- Lyot
- PIAACMC
- 8QPM
- Shaped Pupil
- vAPP

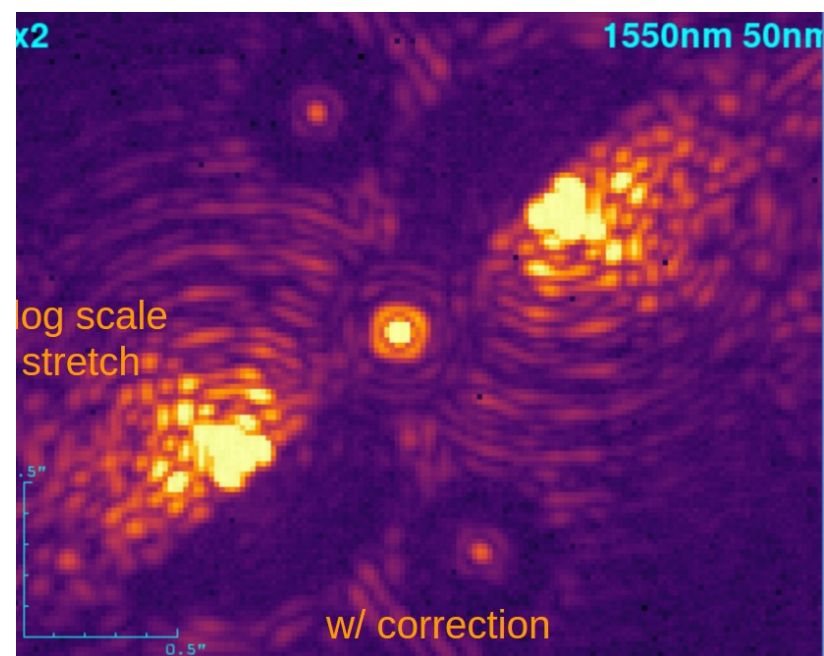




PIAACMC, Knight & Lozi, 2017

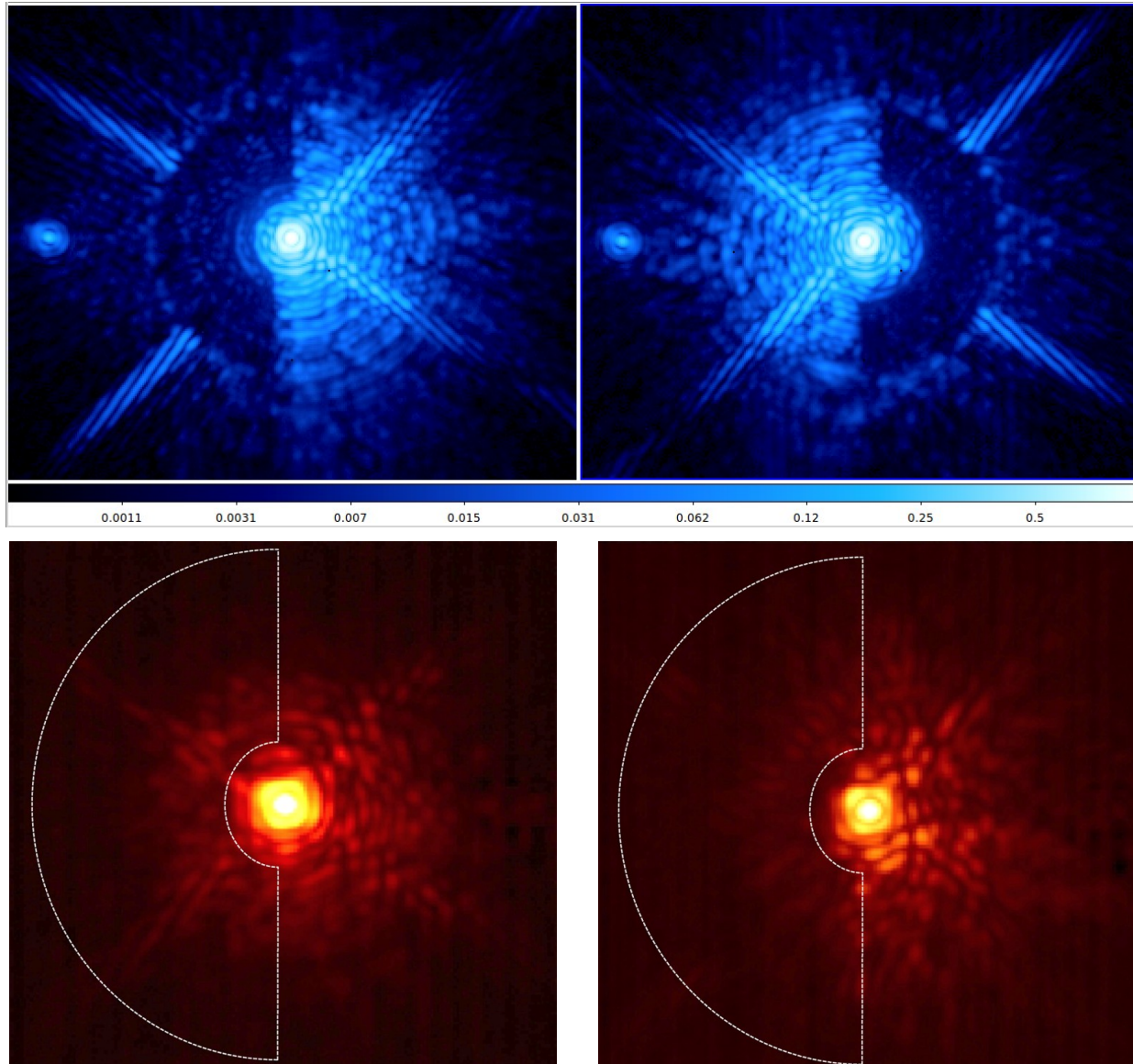


VVC, Lozi & JPL Vortex, 2017



VAPP, Lozi & Leiden University, 2017

Speckle Control



Speckle nulling, in the lab and on-sky (no XAO).

Experience limited by detector readout noise and speed.

KERNEL project: C-RED-ONE camera.

From:

- 114 e- RON
- 170 Hz frame rate

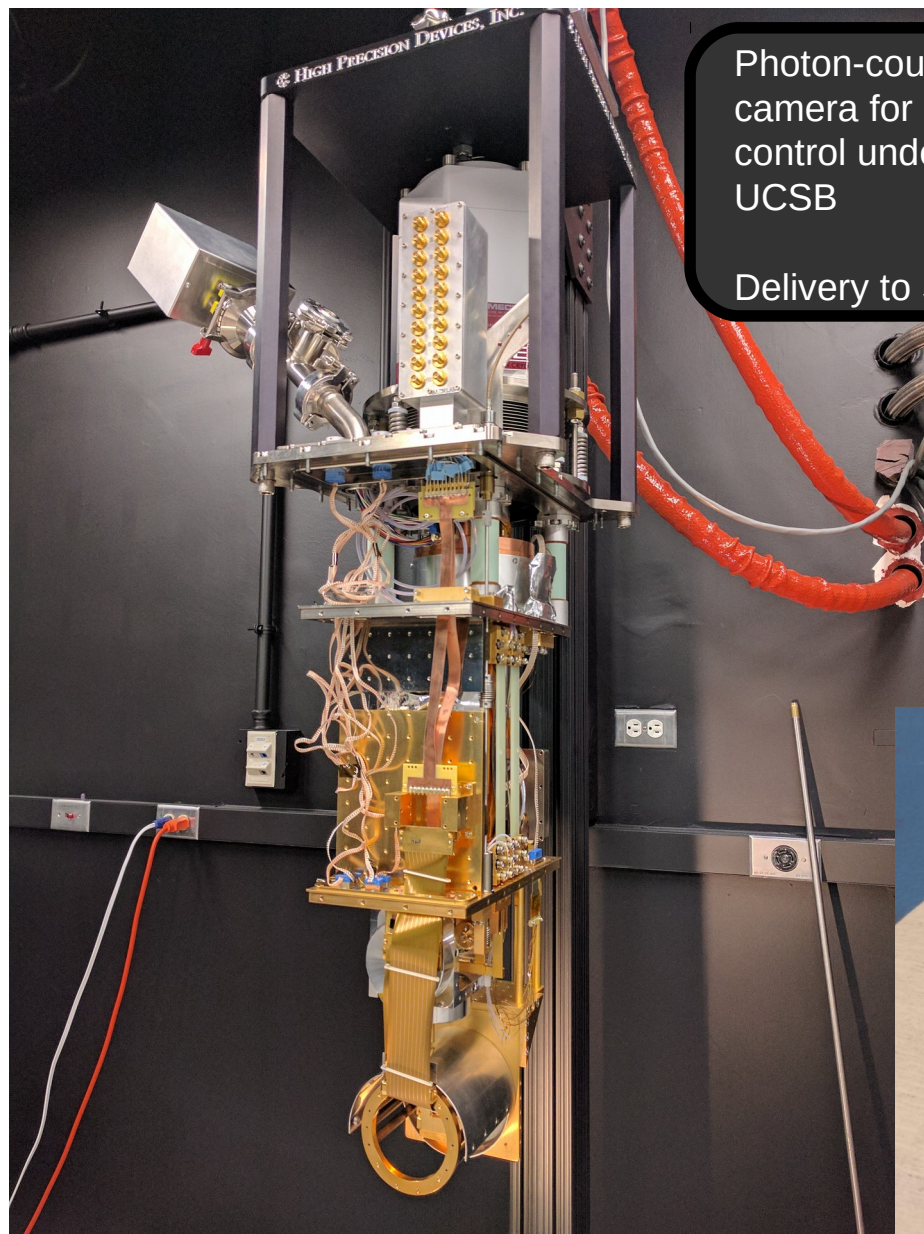
To:

- 0.8 e- RON
- 3500 Hz frame rate

Expect some updates

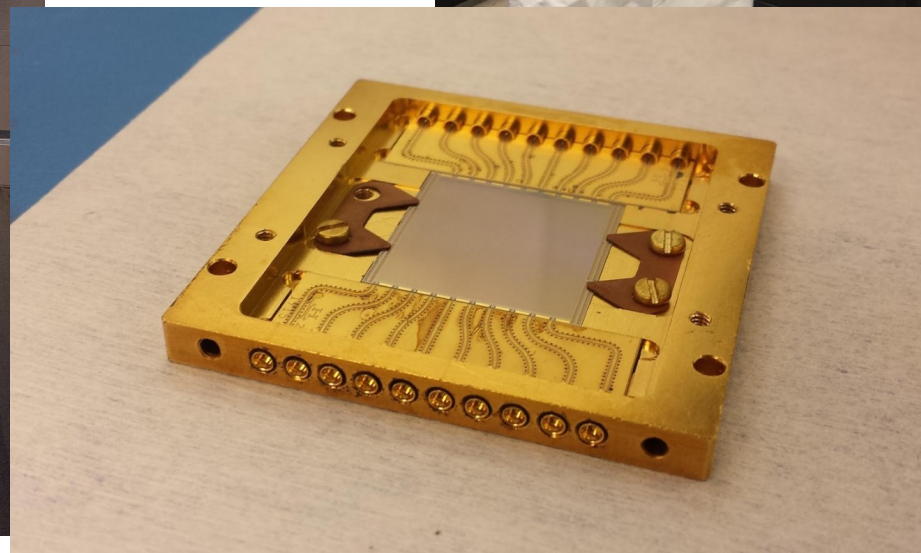
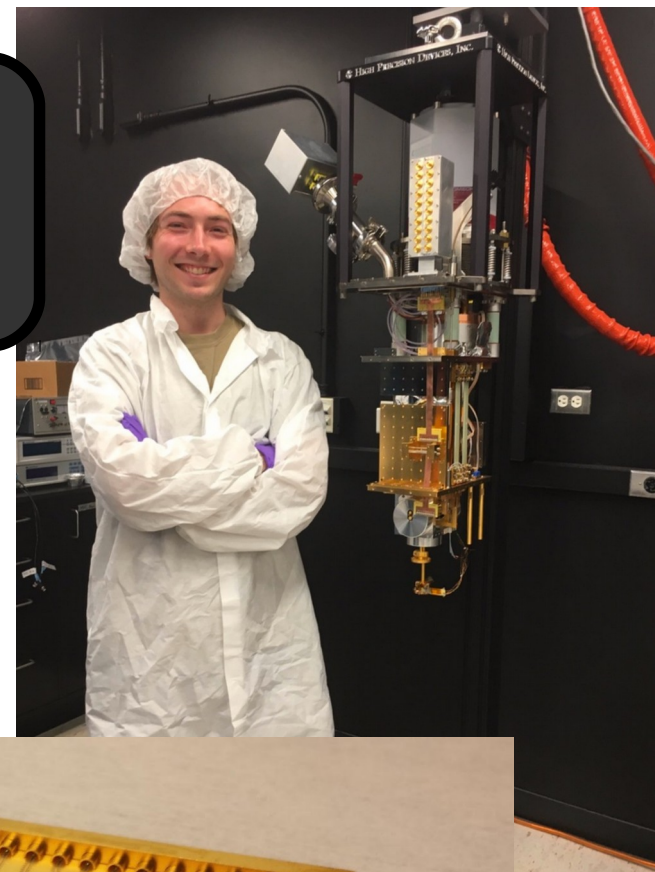
MKIDS camera (built by UCSB for SCExAO)

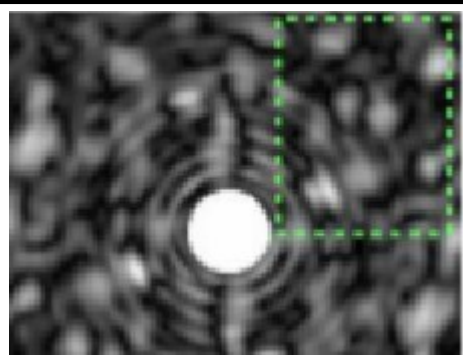
Photon-counting, wavelength resolving 140x140 pixel camera



Photon-counting near-IR MKIDs camera for kHz speed speckle control under construction at UCSB

Delivery to SCExAO in jan 2018



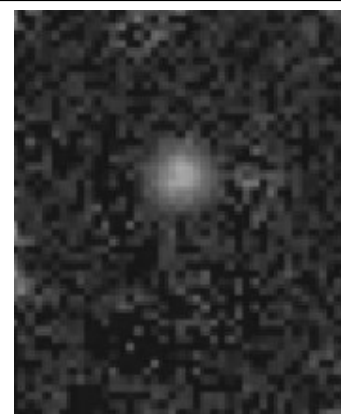


Uncalibrated image

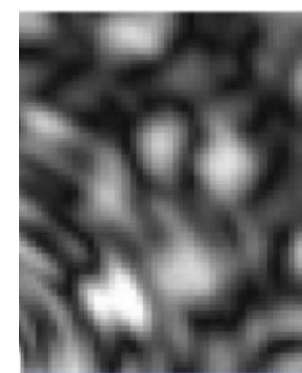
**COHERENT
DIFFERENTIAL IMAGING**

subtract

Speckle SENSING

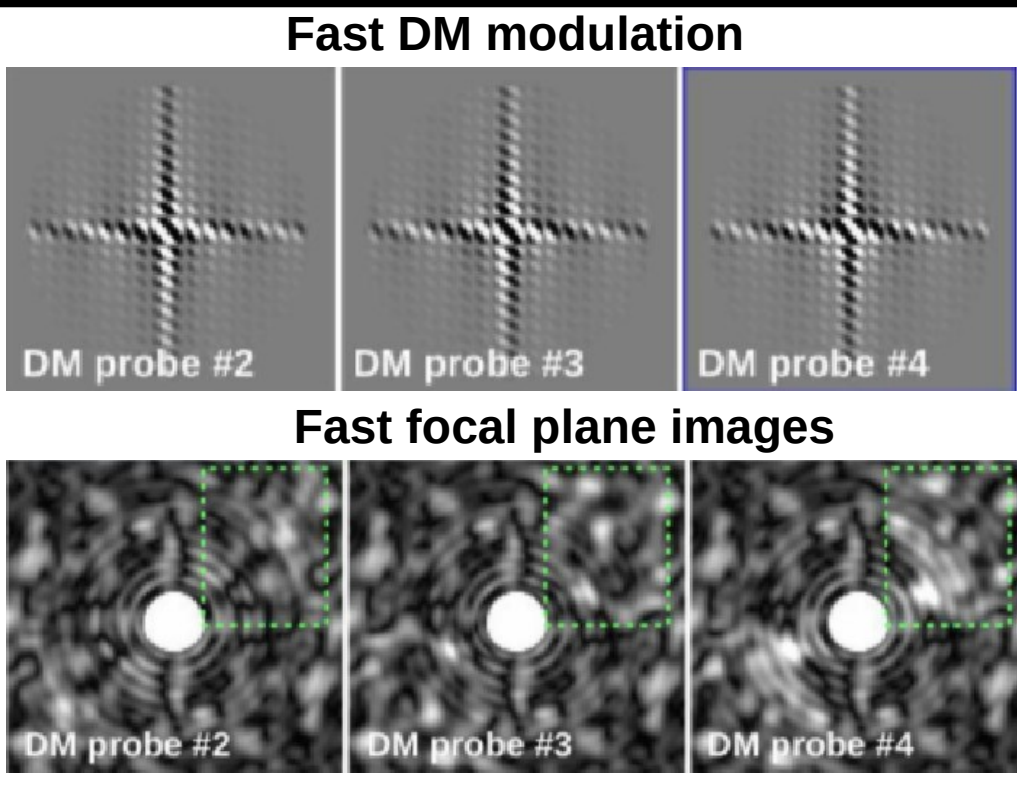


Calibrated image
(incoherent planet light)



Coherent intensity

square
modulus

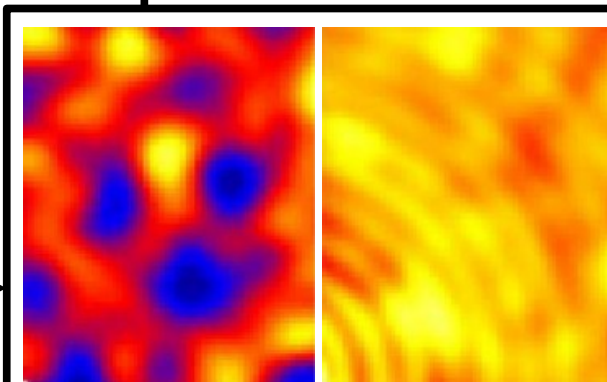


Apply
to DM(s)

Compute DM(s)
solution to cancel
coherent light

Non-linear solver

Speckle CONTROL



Speckle field (coherent)

AO control software (cacao)

Subaru team is co-leading the development of cacao, a high-performance toolkit for AO control, which is gaining wider adoption (Subaru, Magellan, Keck + ESO?)

We will provide software integration to this new standard.

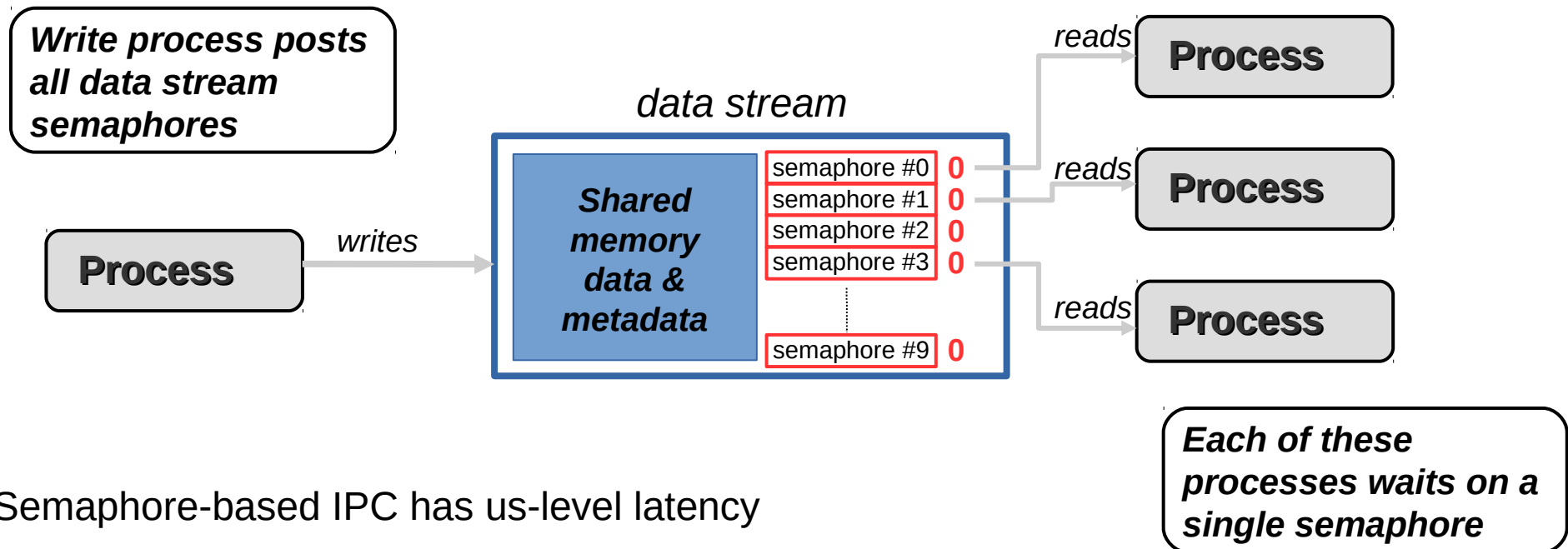
Approach:

Build AO control loop as a finite set of CPU-managed processes.

Processes can manage computations on GPGPU(s)

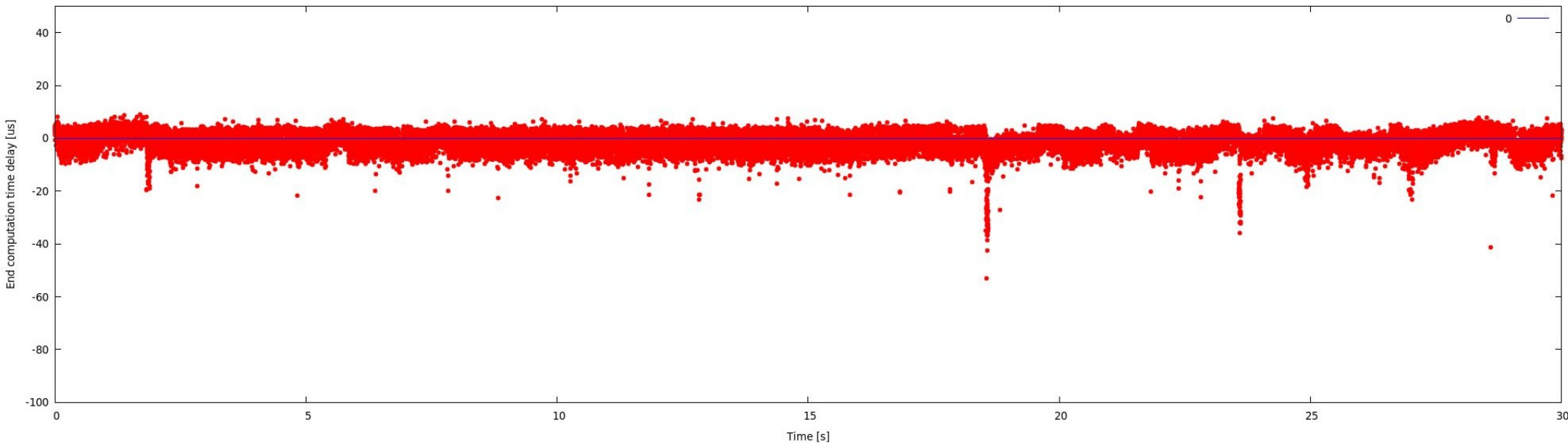
Interprocess communication (IPC) is contained in data: cacao streams are held in shared memory and contain semaphores

→ Complexities of IPC are handled by compiler and Kernel (semaphores, shared memory)



End-to-end Timing Jitter

$\text{RMS} < 5 \text{ us}$, max delay $\sim 50 \text{ us}$

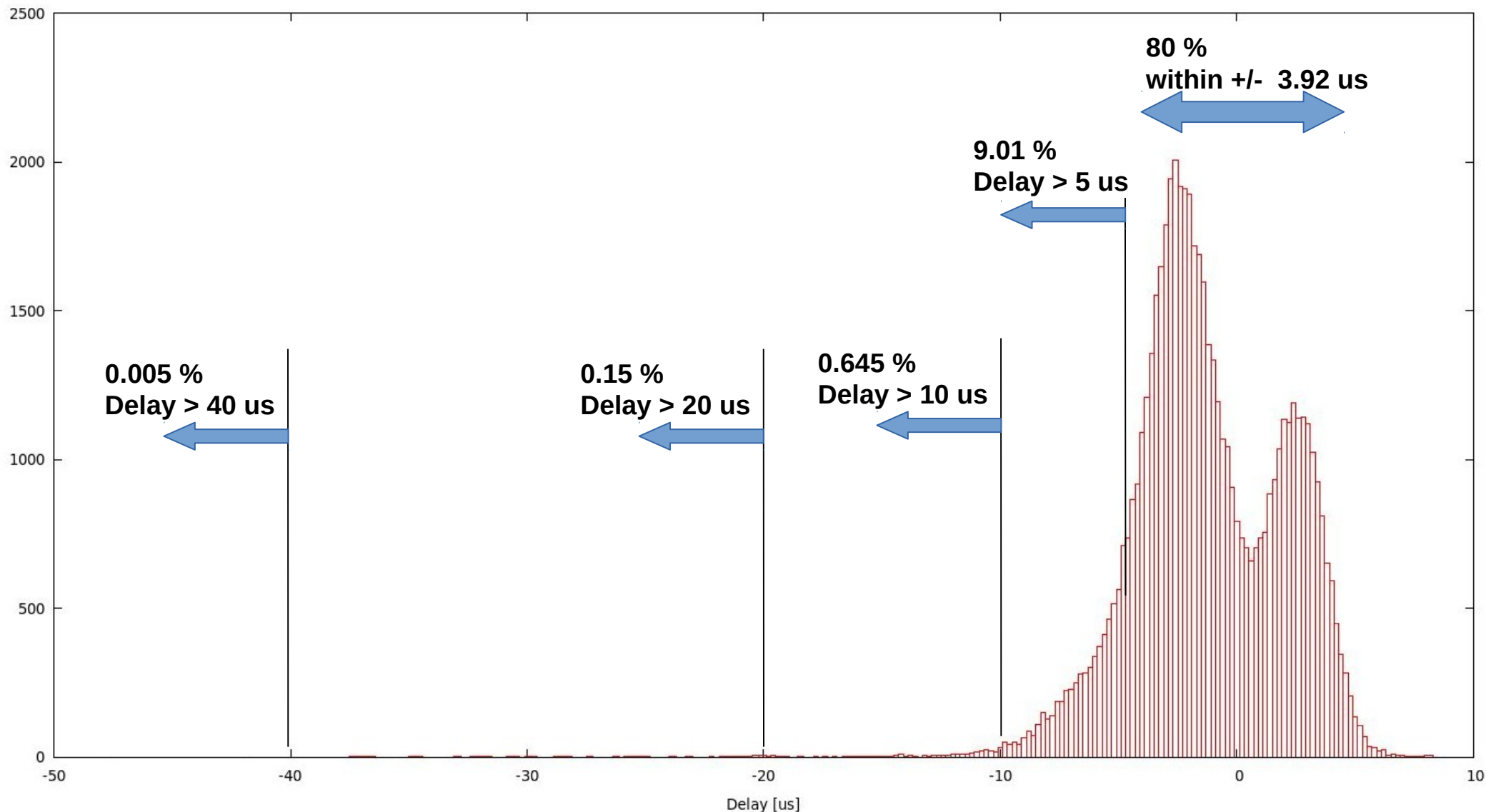


End-to-end timing jitter measured by monitoring completion time of last real-time stream: modal pseudo-open loop coefficients.

Jitter includes following components:

- Hardware synchronization (PyWFS tip-tilt mirror)
- Camera readout
- Data transfer over TCP link
- All real-time computations, CPU and GPU
- Time measurement errors

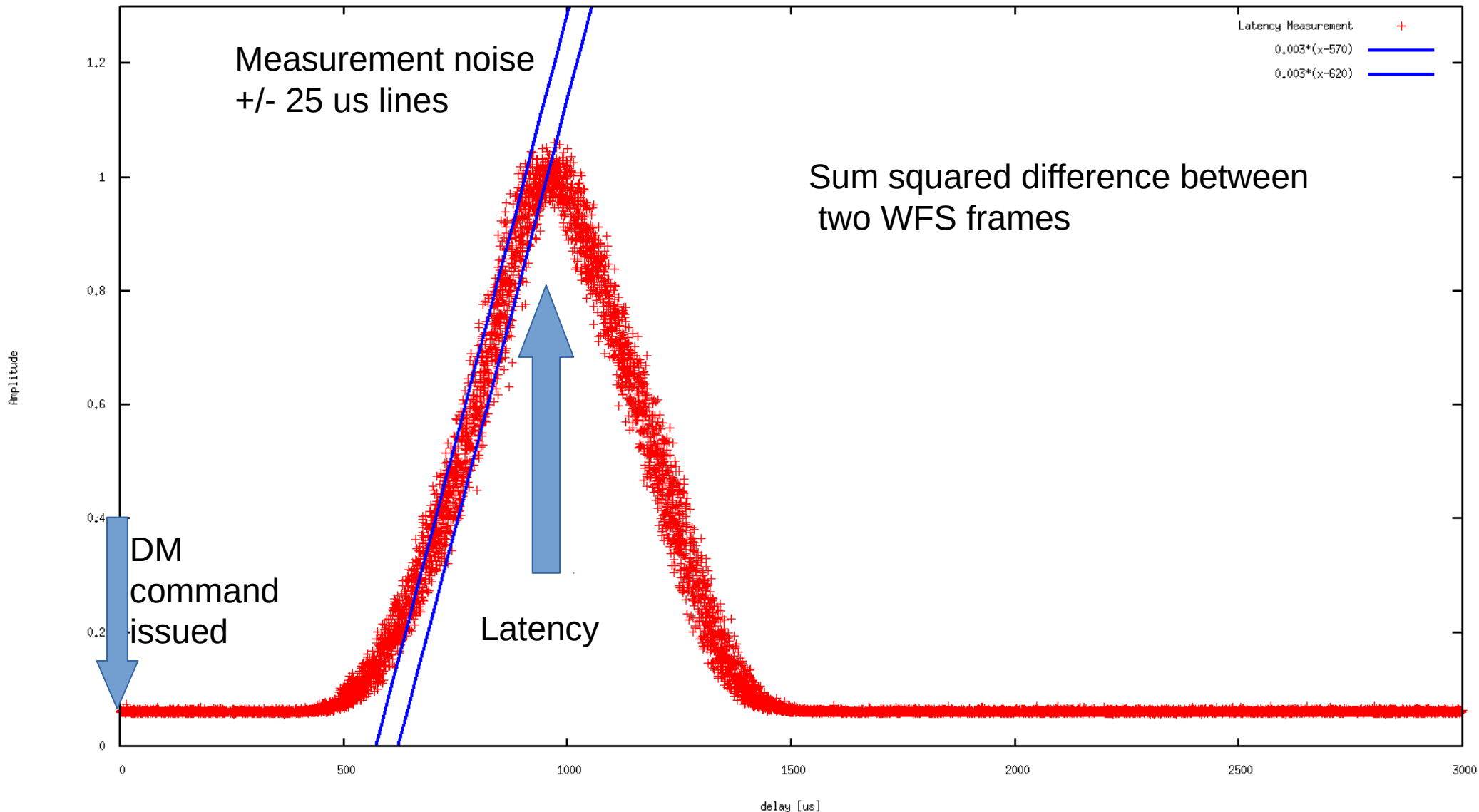
End-to-end Timing Jitter Histogram, measured @ 2kHz



10% of loop iteration @ 2 kHz

Hardware Latency measured on SCExAO

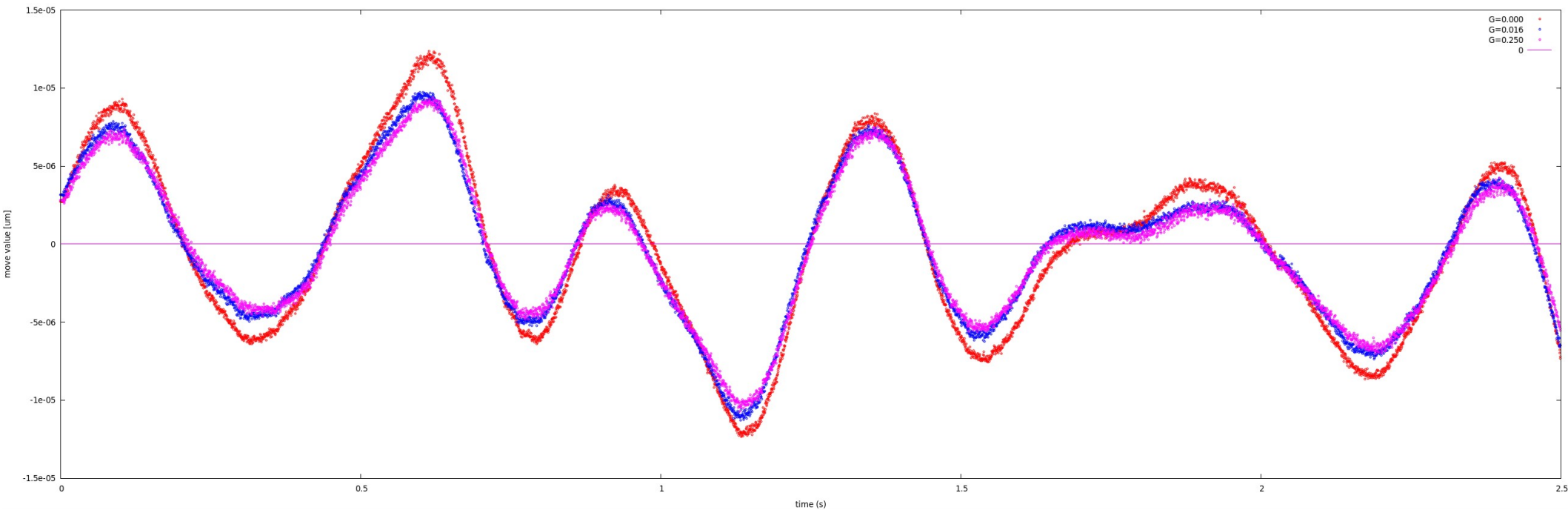
Time between DM command issued and corresponding WFS signal observed
(Camera readout + TCP transfer + processing + DM electronics)



Open loop reconstruction

Comparison between gain values

$G=0.000 \rightarrow$ over-estimates OL values
All $G>0.0$ reconstructions match at %-level

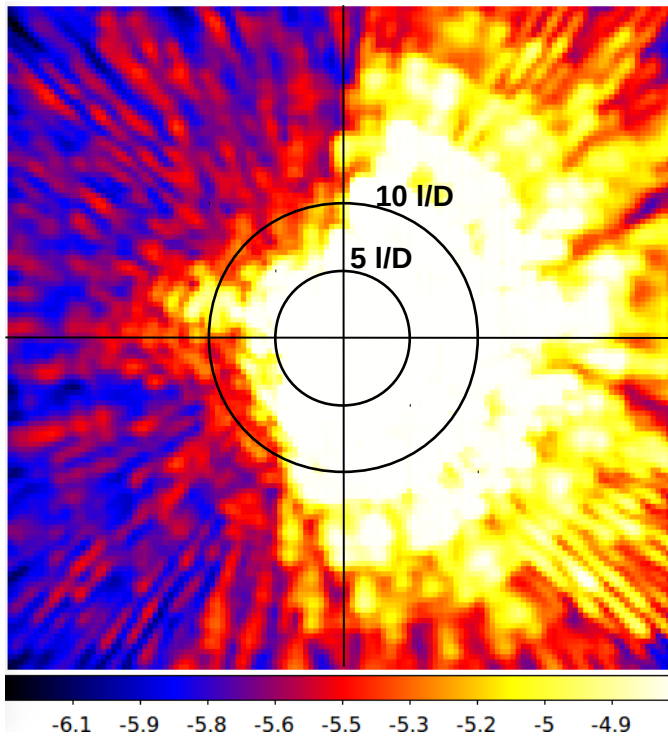


$G=0.000$ test relies entirely on WF residuals for OL estimation
 $G>0.000$ tests rely mostly on DM values for OL estimation

Test shown here uses full speed RM acquisition which underestimates RM by ~15% due to DM time-of-motion $\rightarrow$ reconstructed WFs from WFS are over-estimated by ~15%

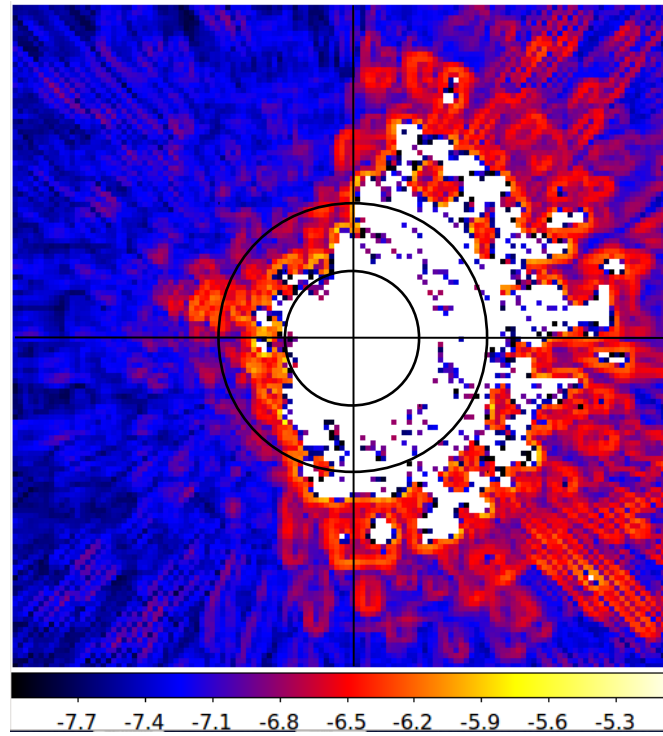
Conventional Lyot Coronagraph, Broadband light: 0.9-1.7 μm (62% wide band)

Raw Contrast



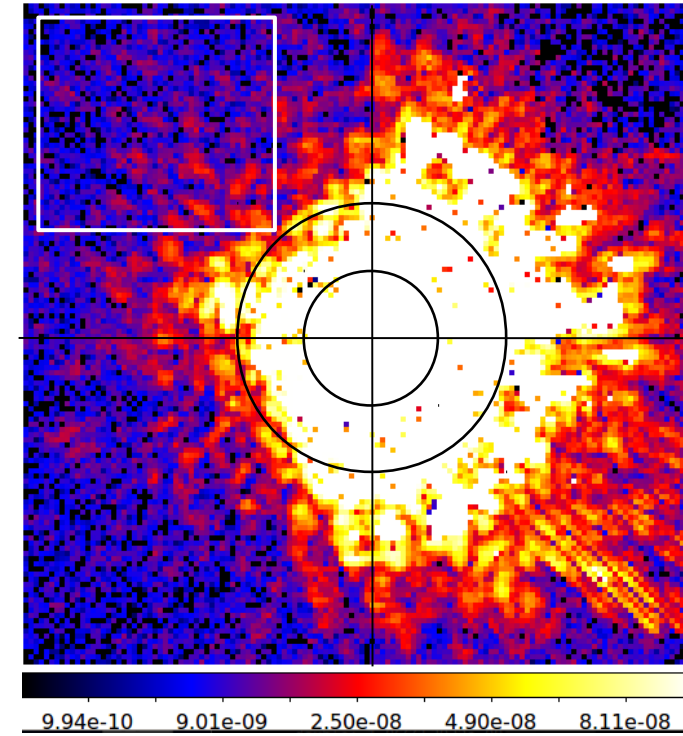
Average raw contrast [15-20 I/D]
= $2.3\text{e-}6$

Open-loop contrast stability

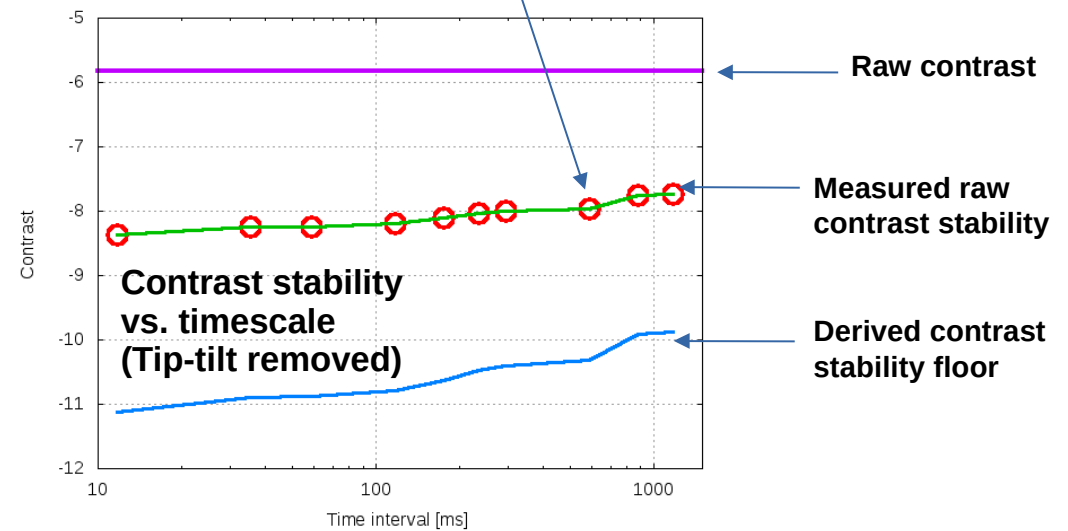
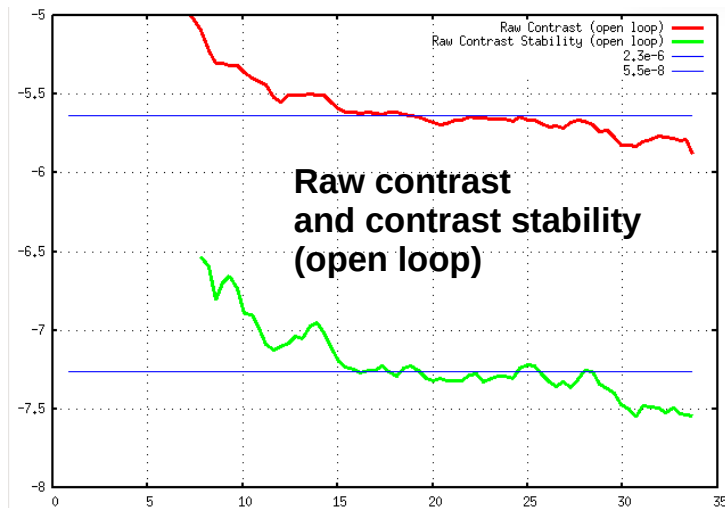


Average raw contrast stability [15-20 I/D]
= $5.5\text{e-}8$

Contrast stability over 0.6 sec



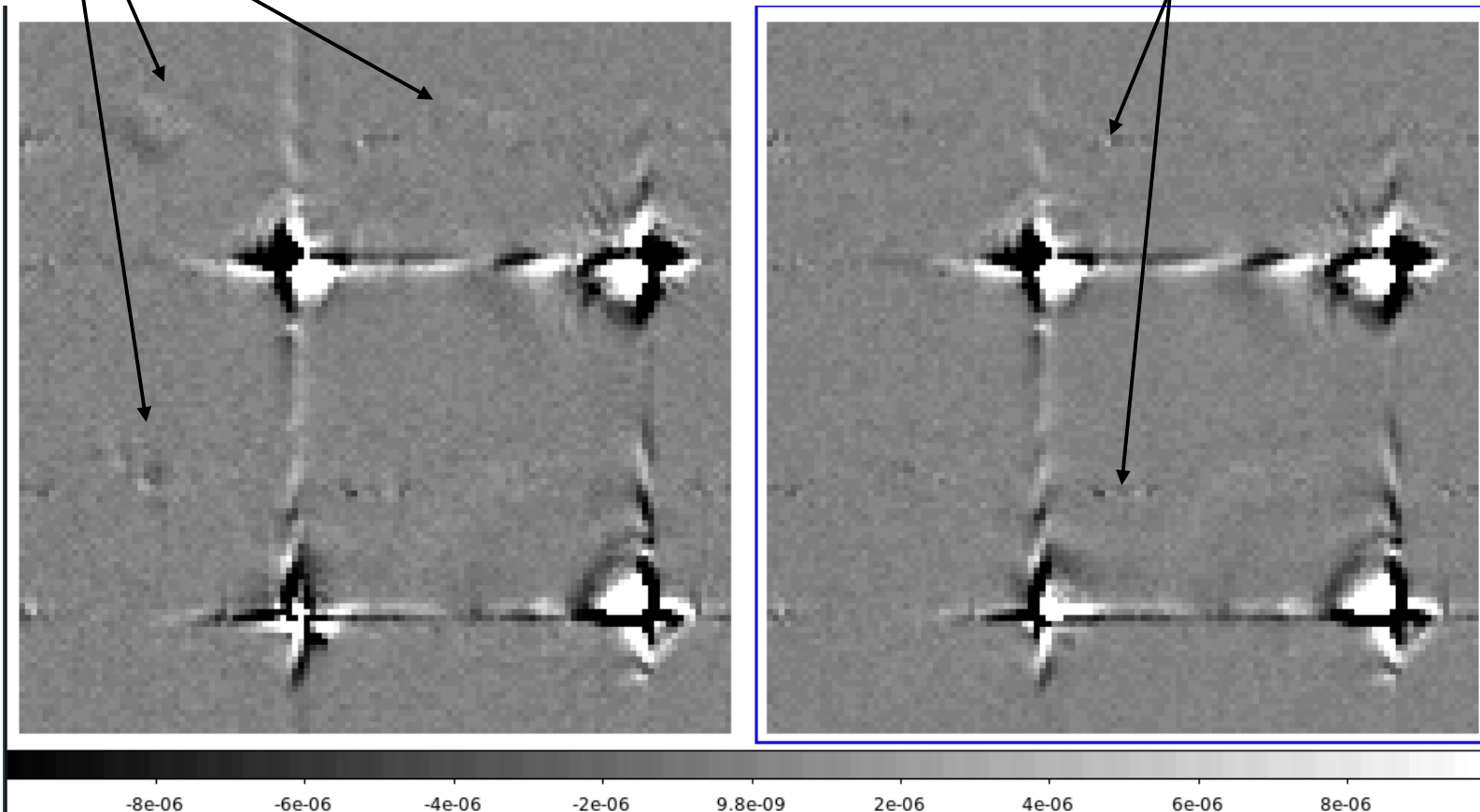
Average raw contrast stability [11-34 I/D]
= $1.1\text{e-}8$ (averaged value within white box)



Fast RM acquisition (4000 Hadamard pokes in 2s @ 2 kHz) + Removing temporal DM response from response matrix by using two poke sequences

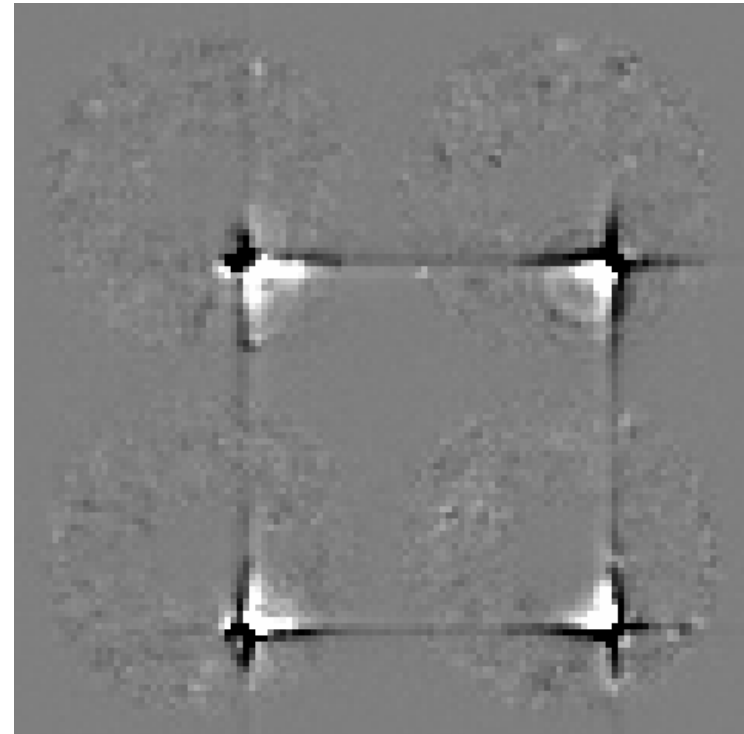
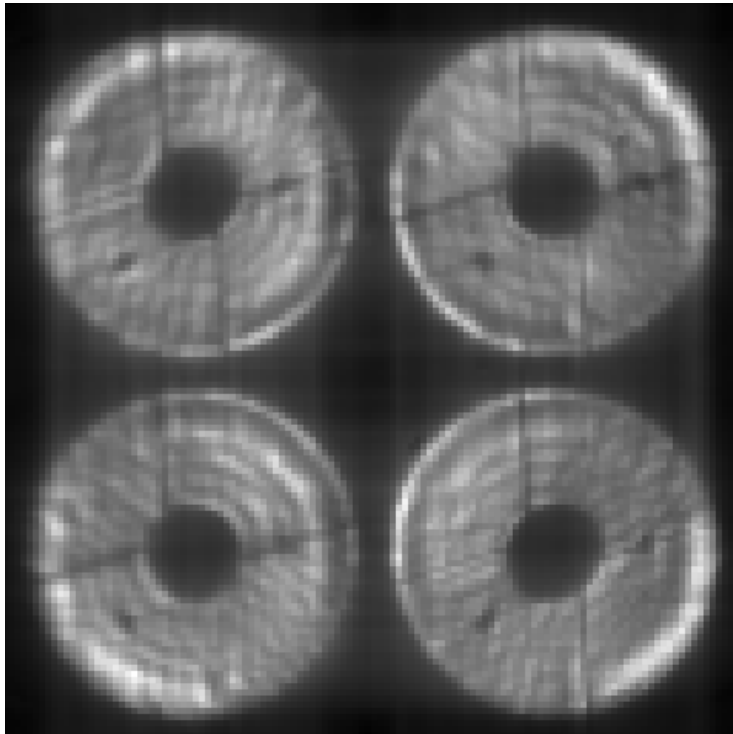
Temporal bleeding from
previous poke pattern
(should be removed
from RM)

Camera readout RF coupling
between pixels
~1% electronic ghosts at 2kHz
frame rate
Needs to be kept in RM



Multi-channel DM virtualization & timing knowledge/stability

→ on-sky response matrix acquisition, while ExAO loop running



Left: WFS reference

Right: Response to single actuator poke (one of 2000)

RM measurement @ 2kHz takes 4000 pokes = 2 sec
Multiple RMs averaged to increase SNR

Removing Hysteresis and DM-induced vibrations from response matrix calibration (piezo curvature DM)



Predictive Control

The main fundamental limit to Extreme-AO correction are that :

(1) FLUX

The star used for measuring aberrations has limited flux
→ measurements are noisy

(2) SPEED

Turbulence is moving fast, and it's very difficult to catch up.

Note: There are also unavoidable latencies in the hardware

In conventional AO systems, we can average the last few measurements to reduce noise → **this adds latency**, so this is not a viable solution for Extreme-AO

SOLUTION: Predictive control optimally uses the last few measurements to predict the aberrations at the time of correction

CHALLENGE: The temporal relationships between past and future aberrations are not known in advance and change continuously (depends on wind speeds and many other things) → we must learn them in real-time: machine learning

The Machine Learning challenge

Need to derive 100s of millions of control matrix (CM) values within minutes, using billions of samples...

Example:

SCEExAO, 3 kHz, 10-step predictive control, 100 sec training

Input: $14,400 \times 3,000 \times 100 = 4.32e9$ measurements

Output: $14,400 \times 2000 \times 10 = 288e6$ CM coefficients

Solution:

We deploy linear ***Machine Learning*** technique on a modal control space (smaller # of dimensions).

We use GPU cores (35,000 cores @ 1.6 GHz in SCEExAO main RTC).

The Machine Learning challenge

One of two GPU chassis

*SCExAO uses 30,000 cores
running @1.3GHz*



Re-thinking adaptive optics

The machine learning approach to predictive control is part of a wider machine learning approach to adaptive optics

Conventional adaptive optics (pre-2018):

Off-sky calibration are performed to write a static control law.

The control law is captured in a control matrix (CM) linking the last measurement to a correction

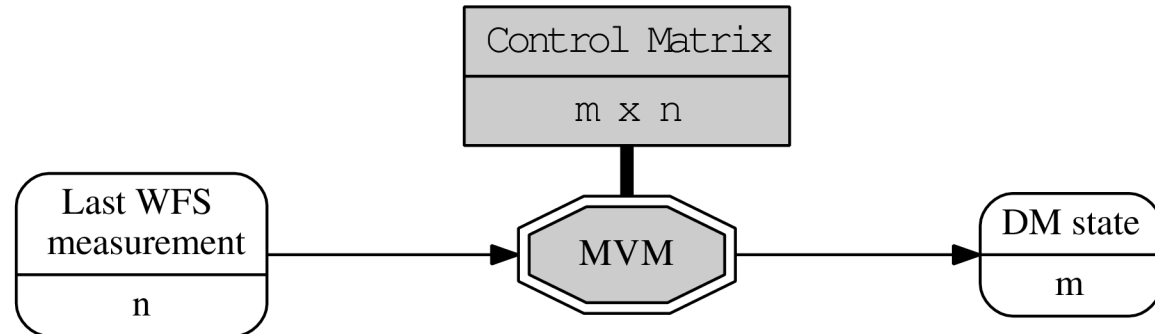
Machine learning based AO:

The control law is continuously optimized based on analysis of real-time measurements. The control law includes predictive control and can also include sensor fusion if multiple sensors are deployed

Predictive Control and Sensor Fusion

Conventional AO:

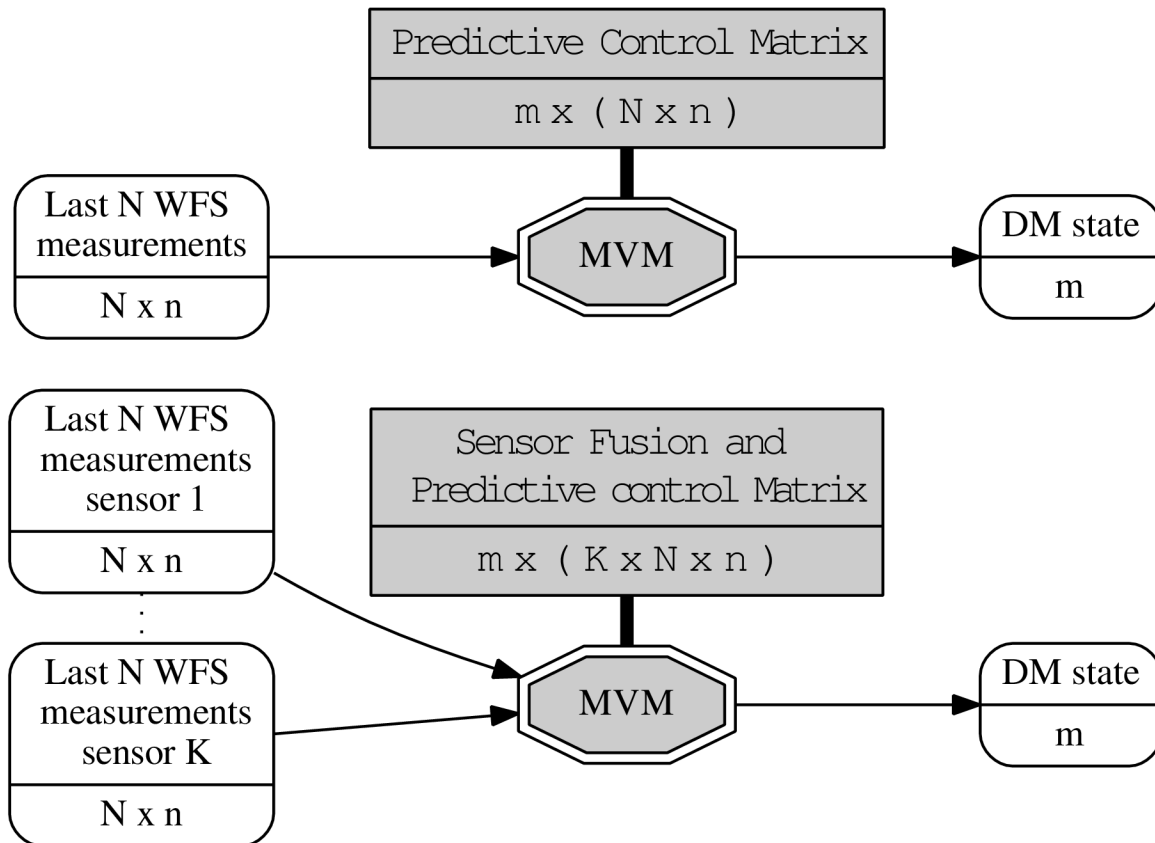
We measure RM/CM



Advanced AO control:

We want to use past measurements (predictive control) and other measurements (sensor fusion) → control matrix is very big, and usually impossible to measure

We derive CM from WFS(s) telemetry

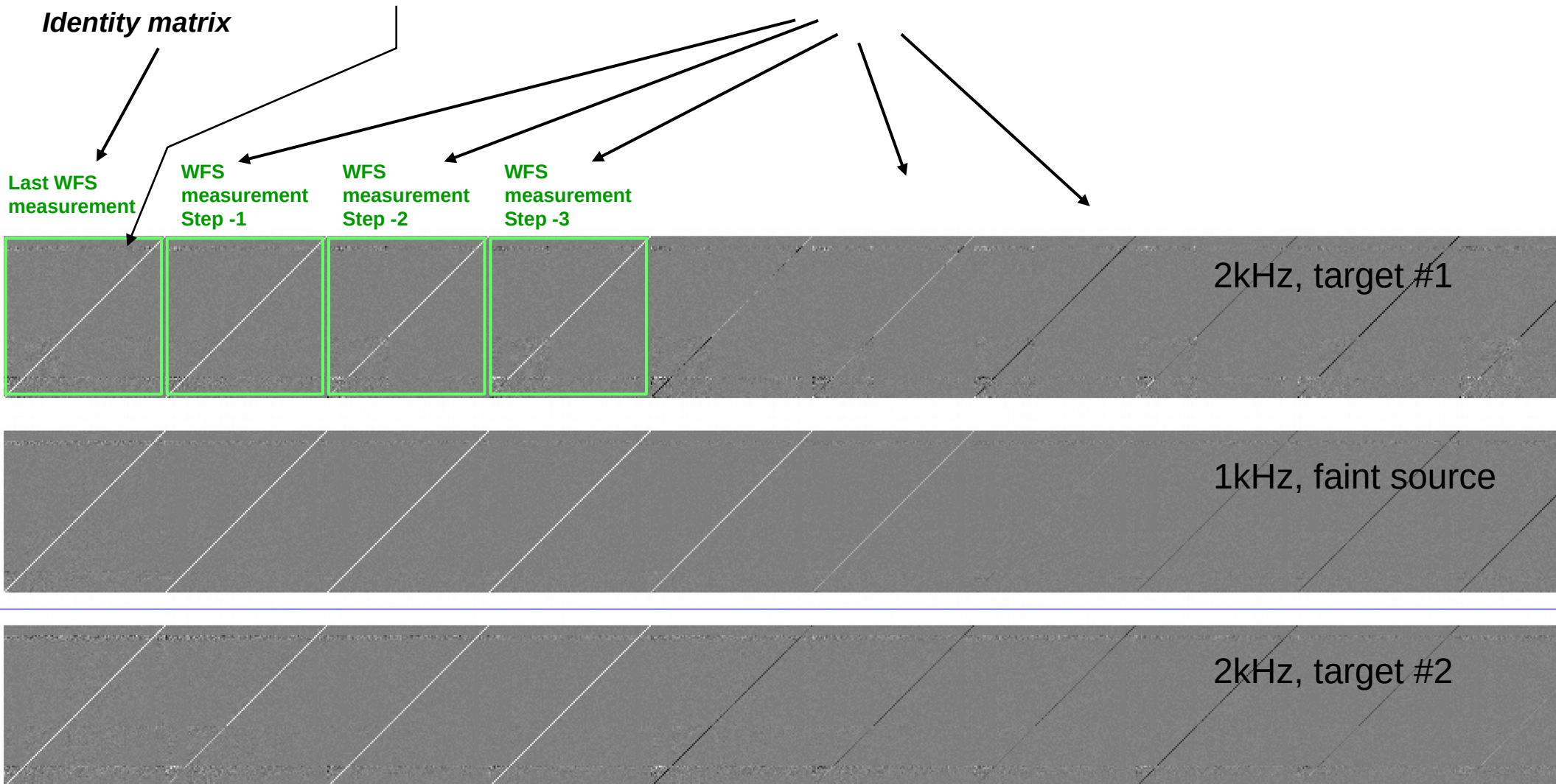


On-sky predictive control matrix (modal representation, 100 modes shown)

Conventional AO would
have control matrix
100 x 100 elements
Identity matrix

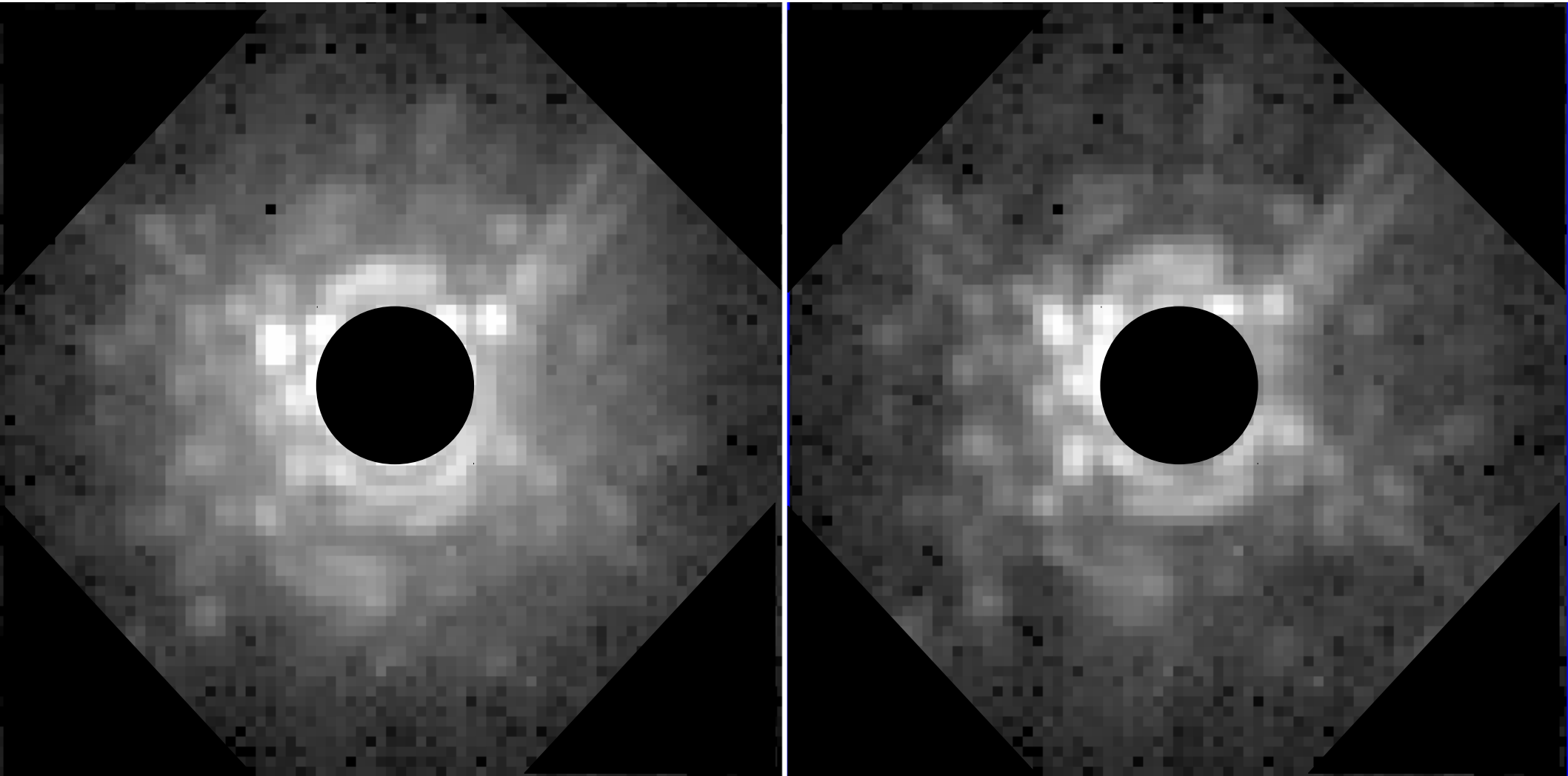
Optimal control adds
elements outside of
diagonal

Predictive control adds
these blocks to control
matrix



First on-sky results (2 kHz, 50 sec update)

→ 2.5x raw contrast improvement



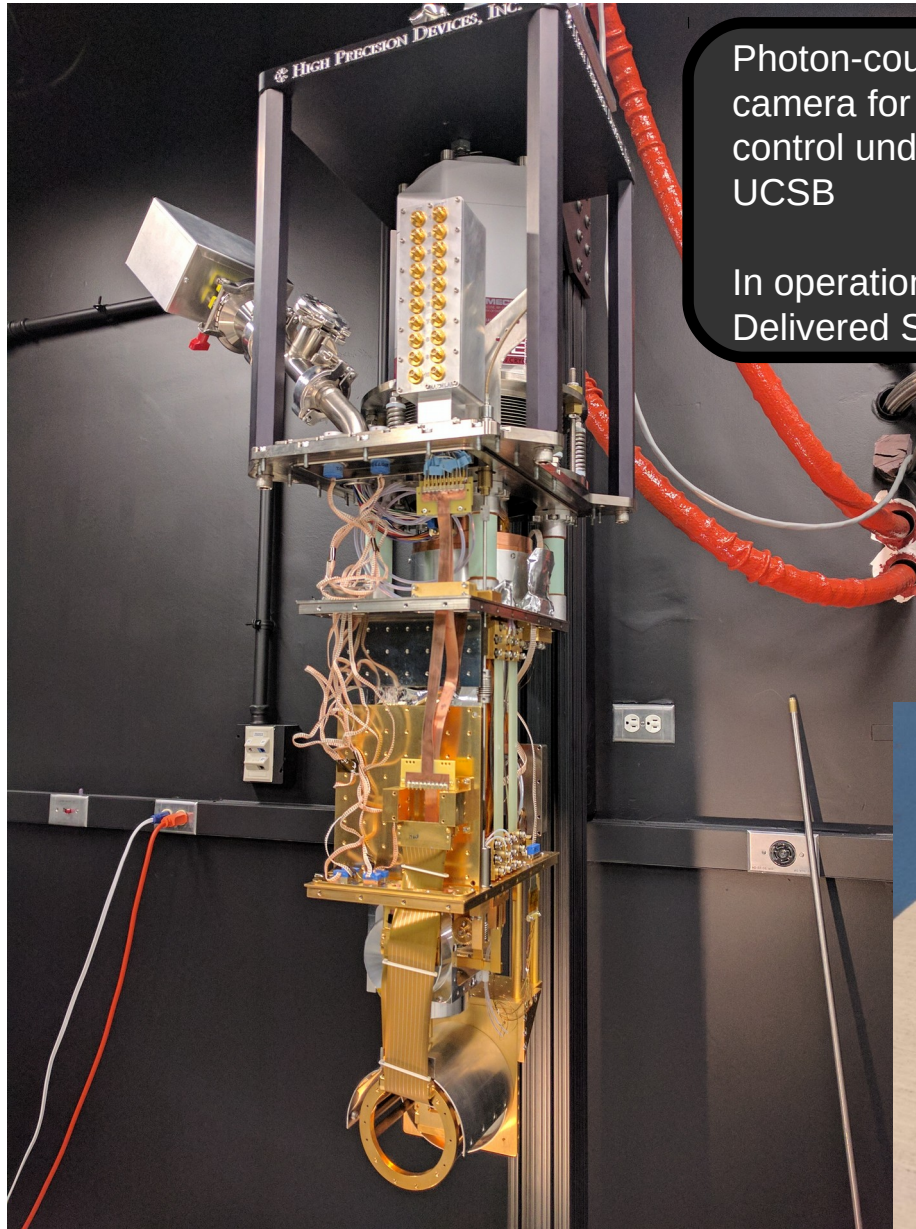
OFF (integrator, gain=0.2)

ON

Average of 54 consecutives 0.5s images (26 sec exposure), 3 mn apart
Same star, same exposure time, same intensity scale

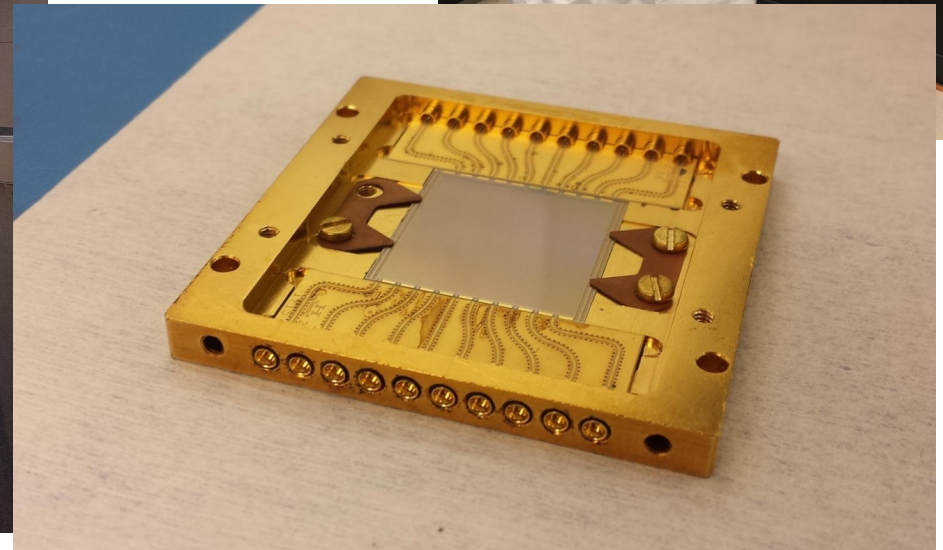
New detectors

Photon-counting, wavelength resolving 140x140 pixel camera



Photon-counting near-IR MKIDs
camera for kHz speed speckle
control under construction at
UCSB

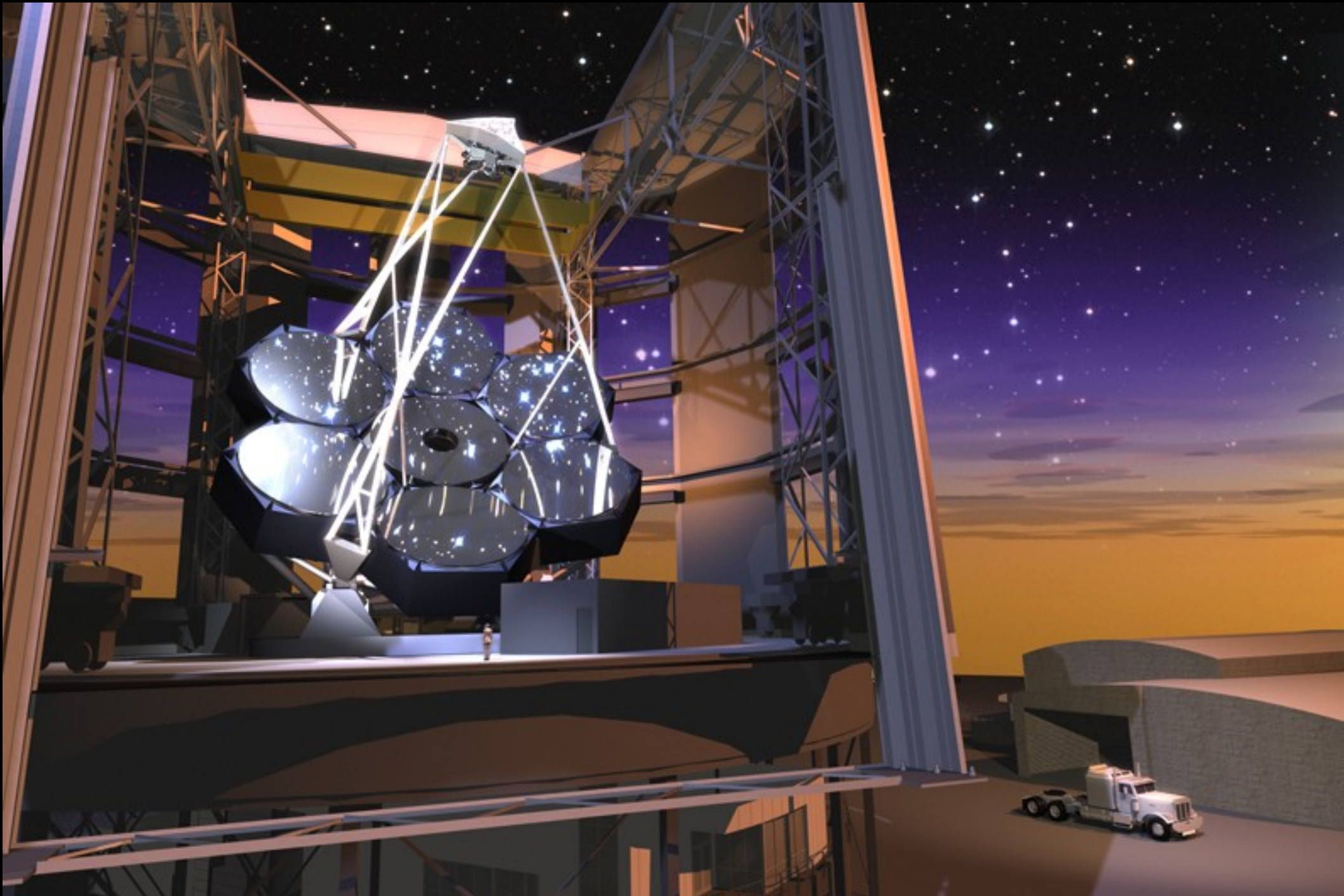
In operation @ Palomar
Delivered SCExAO March 2018



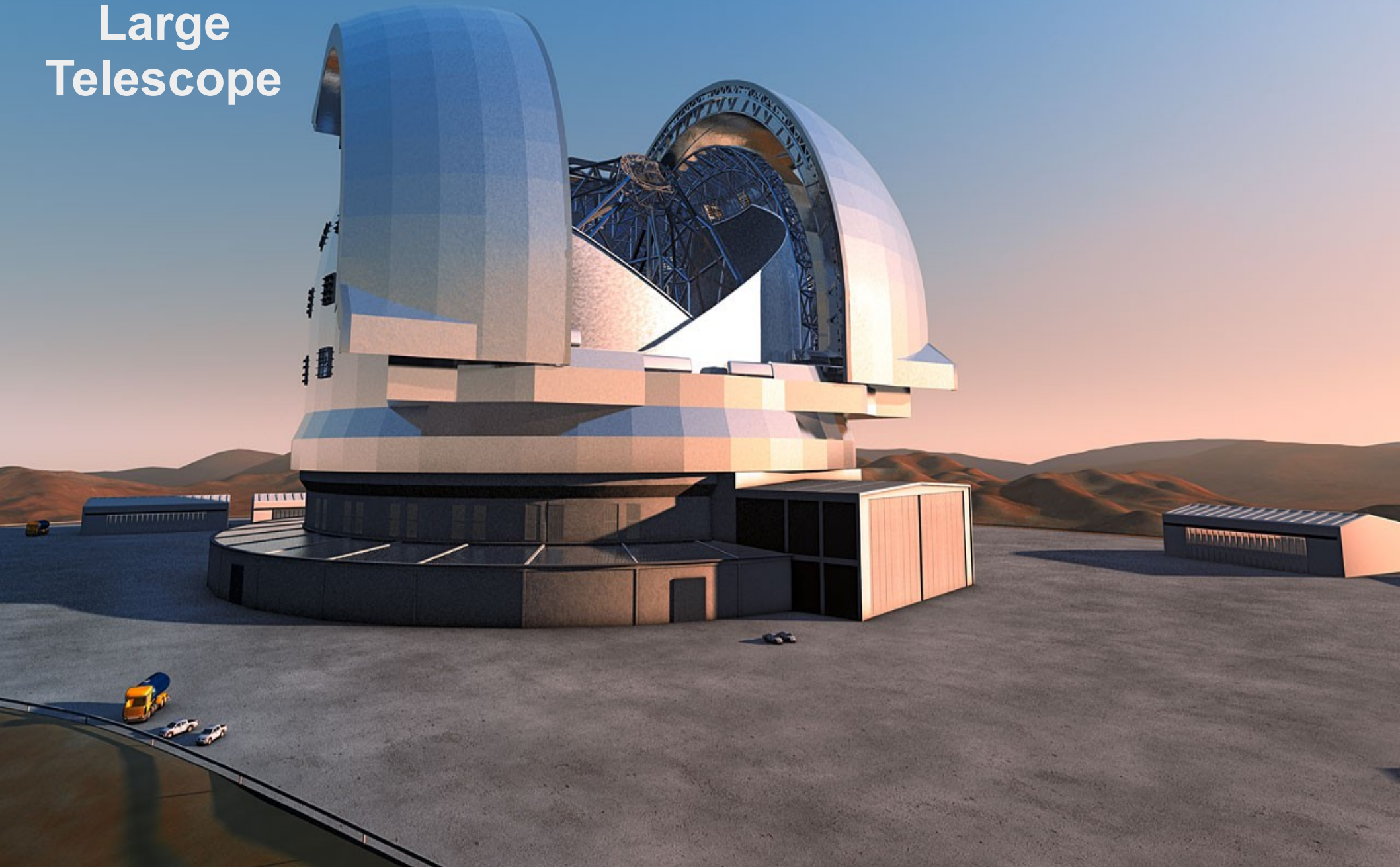
Thirty Meter Telescope



Giant Magellan Telescope



European Extremely Large Telescope



Towards Habitable Planets Imaging

Tools tested on current large telescopes will enable habitable planet imaging on 30-m class telescopes currently in development

Significant challenges in real-time data processing algorithms to extract signal from noise... at multiple kHz with multiple sensors



Habitable planets are stars cooler than Sun will be the easiest to image with large ground-based telescopes
(cooler star → more moderate contrast)