

Advances in AO Systems (fundamental limits)

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JPL-MPIA Workshop, 2018-April-09



Some History

- Angel (1994)

Ground-based imaging of extrasolar planets using adaptive optics

J. R. P. Angel

Steward Observatory, University of Arizona, Tucson, Arizona 85721, USA

The detection of extrasolar planets by direct imaging presents an extraordinary technical challenge. They must be identified against background light scattered from a star close by and about a billion times brighter. It has been supposed that a near-perfect space telescope would be required to avoid atmospheric blurring. But by using adaptive optics operating at fundamental performance limits, the new generation of large ground-based telescopes has the potential to detect planets orbiting nearby stars.



Some History

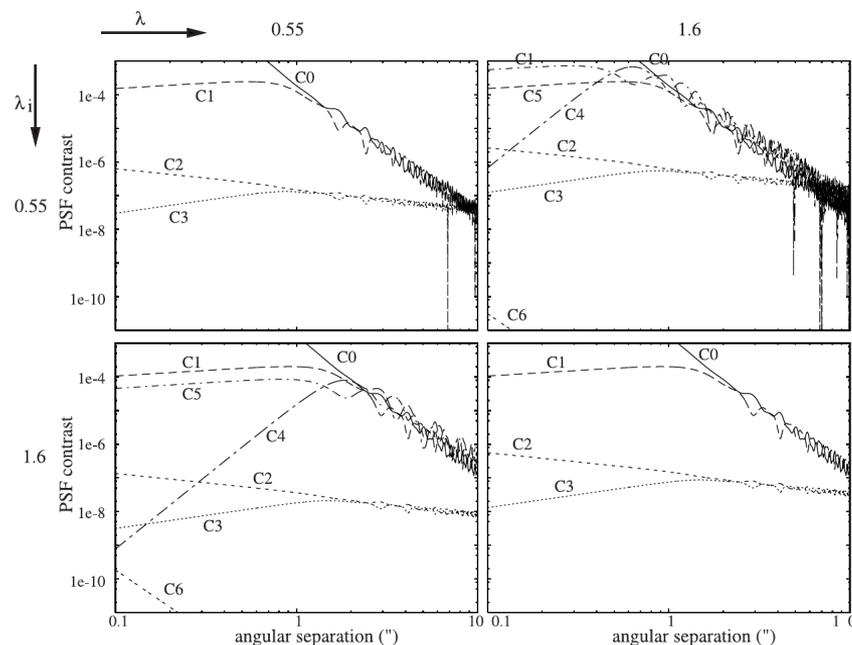
- Angel (1994)
 - Predicted that 6.5 to 12 m ground-based telescopes would be characterizing planets orbiting nearby main-sequence stars in the coming decade.
 - Considered atmospheric speckles, which should average quickly
 - Did not yet know of the monsters called quasi-static speckles waiting just off the edge of the map...





Some History

- Guyon 2005
 - Analyzed the fundamental limits of AO
 - Primarily a spatial-PSD analysis, with simplified version of frozen-flow.





Towards the Fundamental Limit

- Goal: develop a framework for analyzing the fundamental limit of ground-based contrast
 - Closed-loop control analysis
 - Consider full multi-layer turbulent atmosphere
 - Frozen flow, but not limited to this
 - Predict post-coronagraph contrast
 - Analyze the temporal behavior of speckles.

- With apologies: this requires math . . .



A0 Limits

The limit of the planet:star flux ratio that we can detect & characterize is set by the variance of intensity in the focal plane:

$$\sigma_{tot}^2 = F_* \Delta t \left\{ I_c + I_{as} + I_{qs} + F_* \left[\tau_{as} \left(I_{as}^2 + 2[I_c I_{as} + I_{as} I_{qs}] \right) + \tau_{qs} \left(I_{qs}^2 + 2I_c I_{qs} \right) \right] \right\}$$

cf. Soummer et al., “Speckle Noise and Dynamic Range in Coronagraphic Images”, ApJ 669:642 (2007)



Residual Variance

$$\sigma_{tot}^2 = F_* \Delta t \left\{ I_c + I_{as} + I_{qs} + F_* \left[\tau_{as} (I_{as}^2 + 2[I_c I_{as} + I_{as} I_{qs}]) + \tau_{qs} (I_{qs}^2 + 2I_c I_{qs}) \right] \right\}$$

F_* = photons/sec from the star

Δt = total integration time

I_c = intensity residual from the coronagraph & static aberrations

I_{as} = intensity residual from atmospheric speckles

τ_{as} = lifetime of atmospheric speckles

I_{qs} = intensity residual from quasi-static speckles

τ_{qs} = lifetime of quasi-static speckles

cf. Soummer et al., "Speckle Noise and Dynamic Range in Coronagraphic Images", ApJ 669:642 (2007)



Residual Variance - Photons

$$\sigma_{tot}^2 = F_* \Delta t \{ I_c + I_{as} + I_{qs} + F_* [\tau_{as} (I_{as}^2 + 2[I_c I_{as} + I_{as} I_{qs}]) + \tau_{qs} (I_{qs}^2 + 2I_c I_{qs})] \}$$



Photon Noise (Poisson statistics)



Residual Variance - Speckles

$$\sigma_{tot}^2 = F_* \Delta t \left\{ I_c + I_{as} + I_{qs} + F_* \left[\tau_{as} (I_{as}^2 + 2[I_c I_{as} + I_{as} I_{qs}]) + \tau_{qs} (I_{qs}^2 + 2I_c I_{qs}) \right] \right\}$$

Speckle Noise



Residual Variance - Speckles

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nasty

Speckle Noise



Residual Variance - Speckles

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Residual
atmospheric
speckles

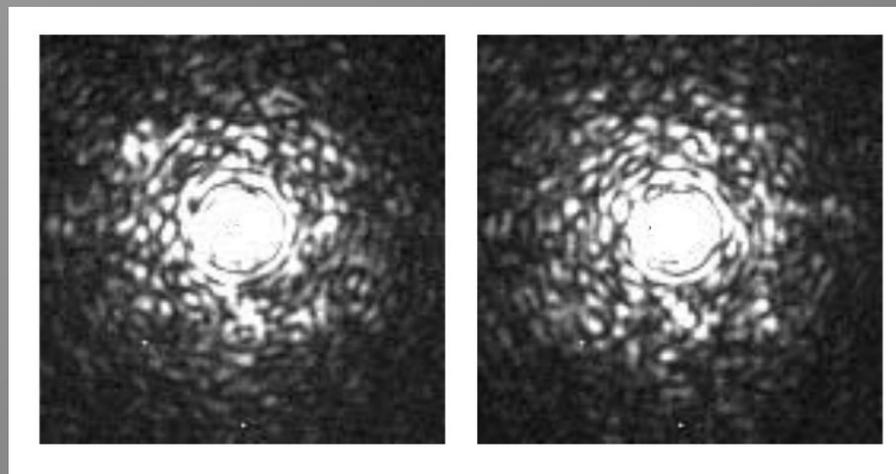


Residual Variance - Speckles

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pinned by
Airy Pattern

pinned by
quasi-static



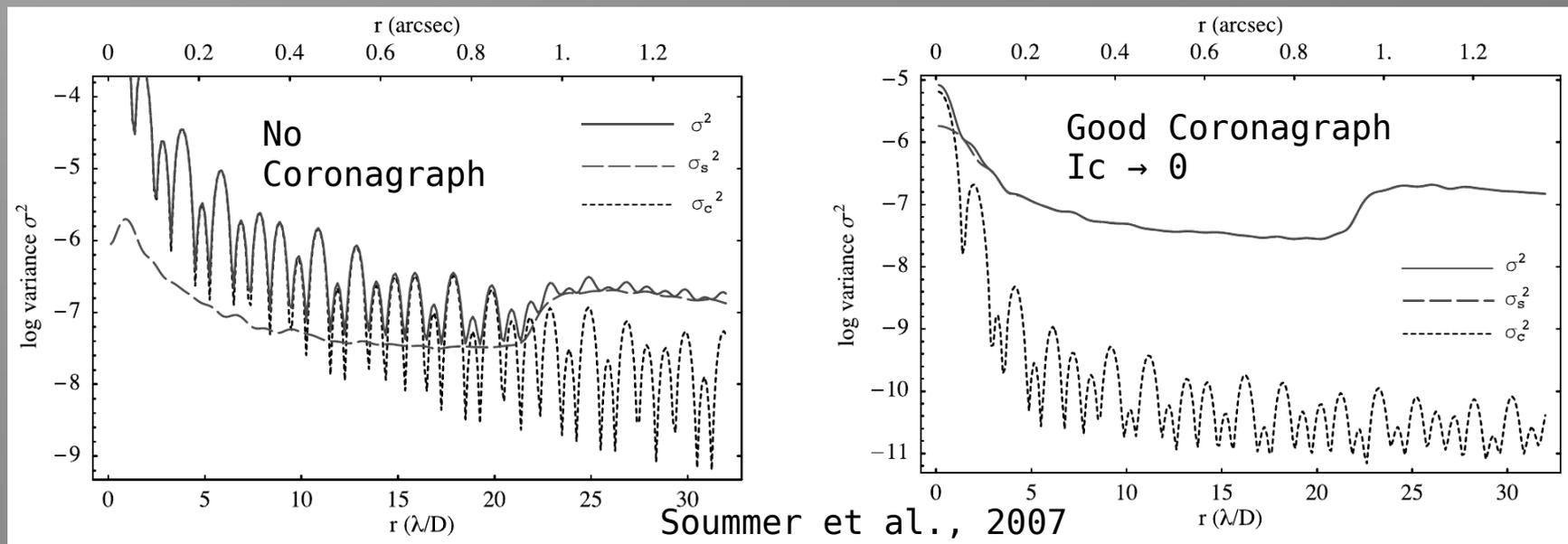
Soumer et al., 2007



Residual Variance - Speckles

$$\sigma_{tot}^2 = F_* \Delta t \left\{ I_c + I_{as} + I_{qs} + F_* \left[\tau_{as} \left(I_{as}^2 + 2[I_c I_{as} + I_{as} I_{qs}] \right) + \tau_{qs} \left(I_{qs}^2 + 2I_c I_{qs} \right) \right] \right\}$$

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Residual Variance - Speckles

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- Coronagraph design is now quite advanced, (thanks WFIRST CGI!)
- It is not a wild assumption to ignore it, and that's what I'm going to do from now on.
- But: it is common to hear things like:

“well, we'll only ever achieve 1e-5 AO residual, so that's all we need from the coronagraph”

This is wrong. Because of pinning, coronagraph performance (I_c) must be much better than AO (I_{as}).

- Note also that I_c includes truly static aberrations, or (say) very long lived ones. So this also has implications for discussion of design and stability of ground-based instruments.



Residual Variance - Speckles

$$\sigma_{tot}^2 = F_* \Delta t \left\{ I_c + I_{as} + I_{qs} + F_* \left[\tau_{as} (I_{as}^2 + 2[I_c I_{as} + I_{as} I_{qs}]) + \tau_{qs} (I_{qs}^2 + 2I_c I_{qs}) \right] \right\}$$

quasi-static
speckles





Understanding Ground-Based Contrast

- Understanding the limits of ground-based HCI requires:

1) Predict residual atmospheric speckle contrast I_{as}

2) Predict residual atmospheric speckle lifetime τ_{as}

3) Predict quasi-static speckle contrast I_{qs}

4) Predict quasi-static speckle lifetime τ_{qs}



Step 1: Residual Atmosphere

- AO control as a time-domain control problem is described by the temporal PSD

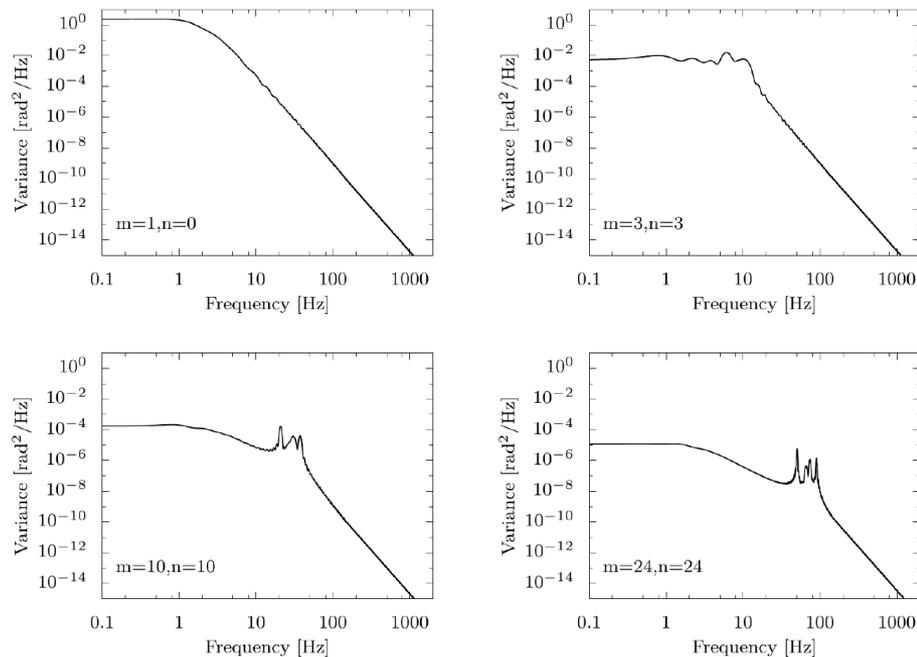


Fig 6 Calculated temporal PSDs in a 7-layer turbulence model at 4 different modes, corresponding to discrete spatial frequencies.

Males & Guyon, JATIS, 2018

These are the temporal PSDs, $\mathcal{T}_{mn}(f)$ of individual Fourier modes (or spatial frequencies) in the atmosphere.

Calculations assumed frozen-flow von Karman turbulence, with LCO median conditions.

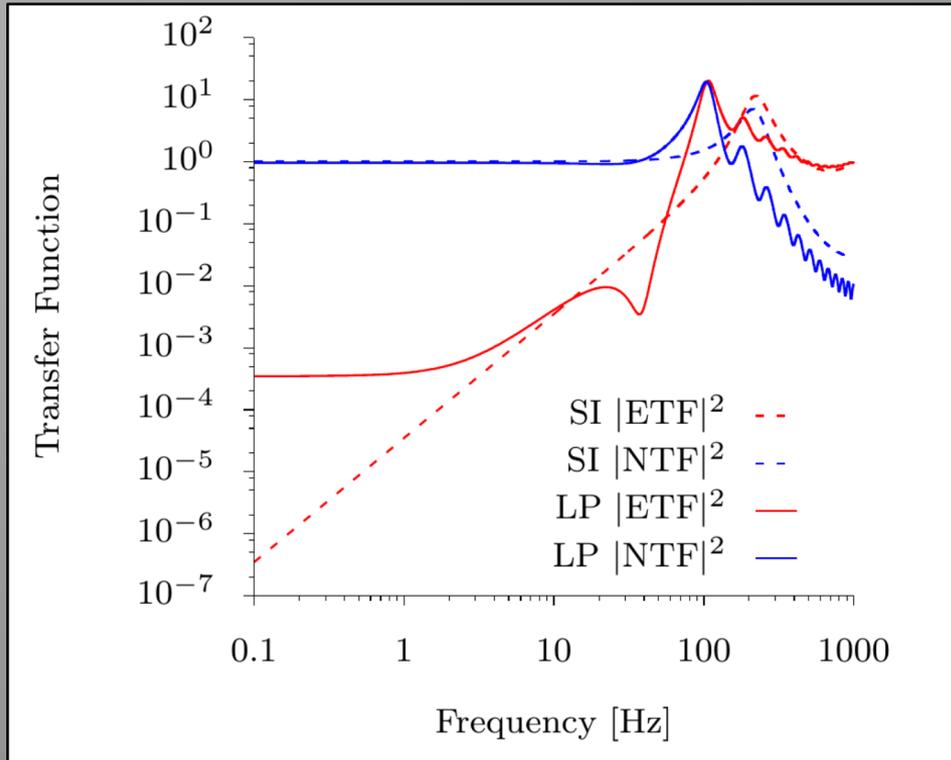
$\mathcal{T}_{mn}(f)$ describes the statistics of the modal amplitudes h_{mn}

The variance of the modal amplitudes $\langle |h_{mn}|^2 \rangle$ gives the contrast:

$$\langle I_{\Phi}(\vec{r}) \rangle = \left(\frac{2\pi}{\lambda} \right)^2 \langle |h_{mn}|^2 \rangle \left[\text{PSF}(\vec{r} - \vec{k}_{mn}\lambda) + \text{PSF}(\vec{r} + \vec{k}_{mn}\lambda) \right]$$



Transfer Functions



Males & Guyon, JATIS, 2018

- AO control acts on the input PSD.
- The output of the control system is described by its *transfer functions*

$$\mathcal{T}_{cl,mn}(f;g) = \mathcal{T}_{mn}(f) |ETF_{cl}(s;g)|^2 + \mathcal{T}_{ph,mn}(f) |NTF_{cl}(s;g)|^2$$

ETF = error transfer function

NTF = noise transfer function

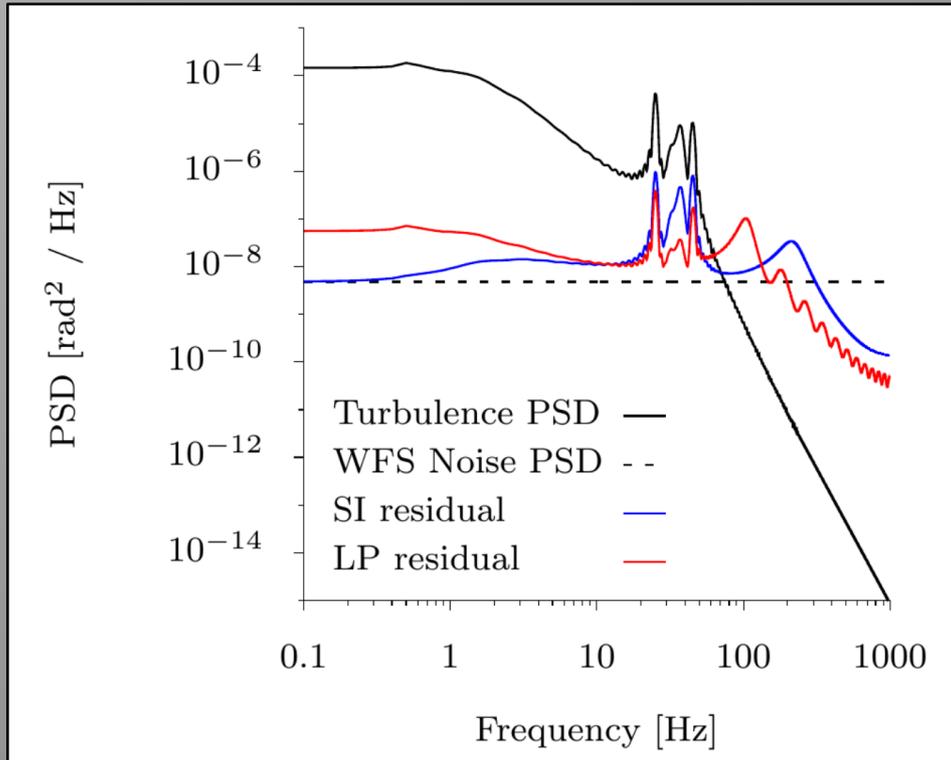
- The residual variance, hence the contrast, is given by:

$$\langle h_{mn}^2 \rangle (g) = \int_0^{f_s} \mathcal{T}_{cl,mn}(f;g) df$$

- Goal: design system with variance minimizing ETF and NTF



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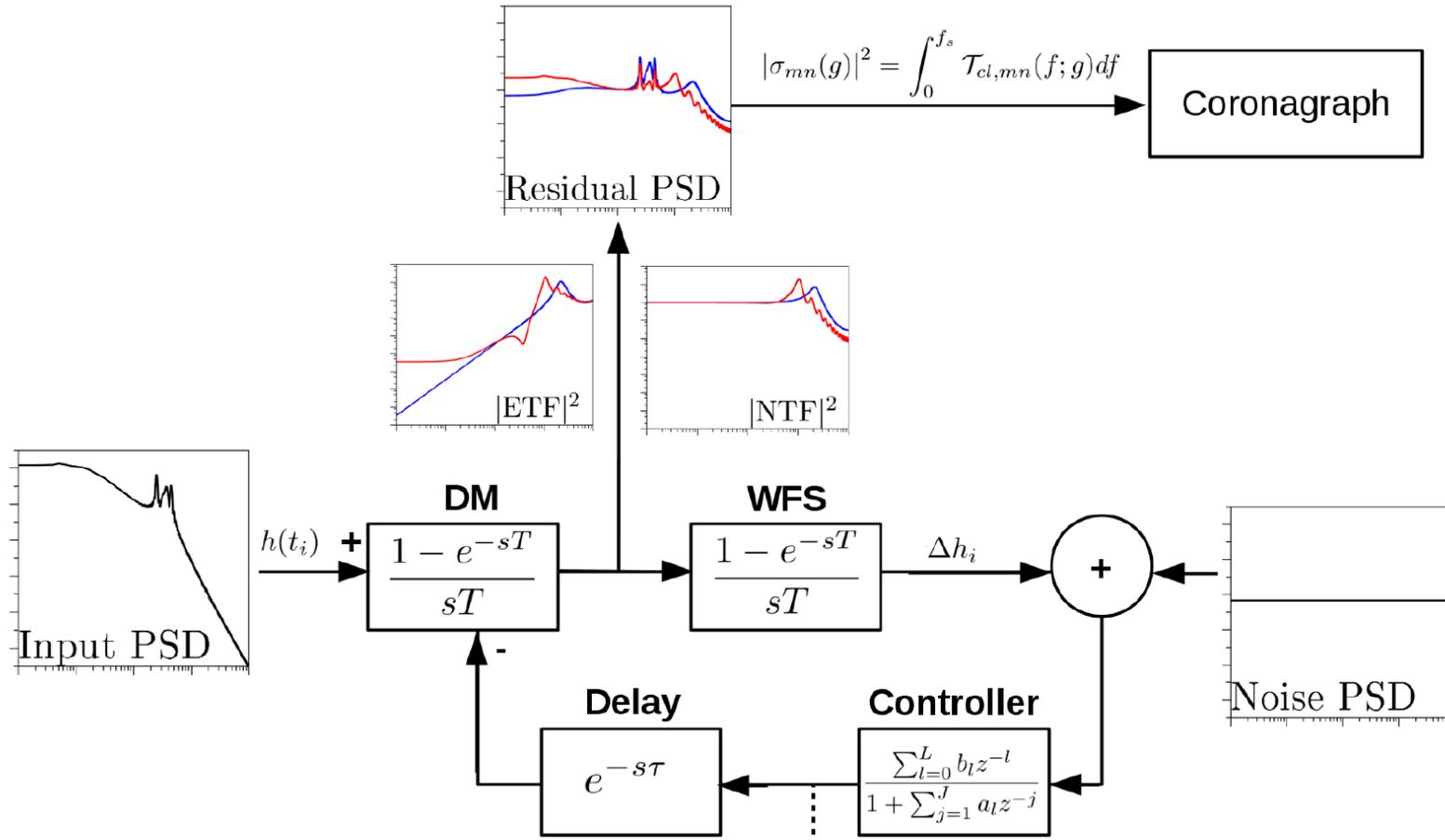
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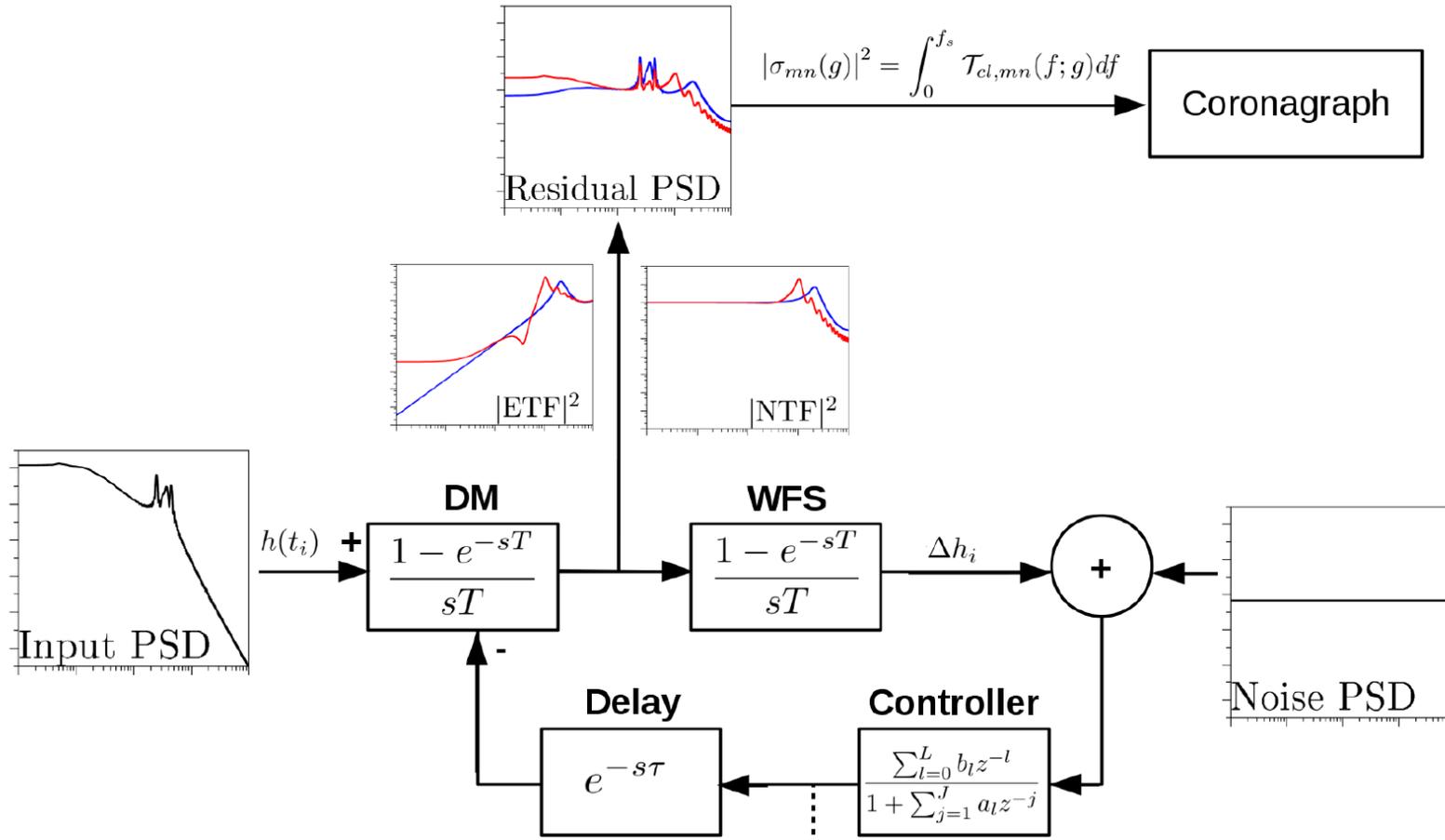
A0 Control System



$$\tilde{h}(t_i) = \sum_{j=1}^J a_j \tilde{h}(t_{i-j}) + \sum_{l=0}^L b_l \Delta h(t_{i-l})$$



A0 Control System



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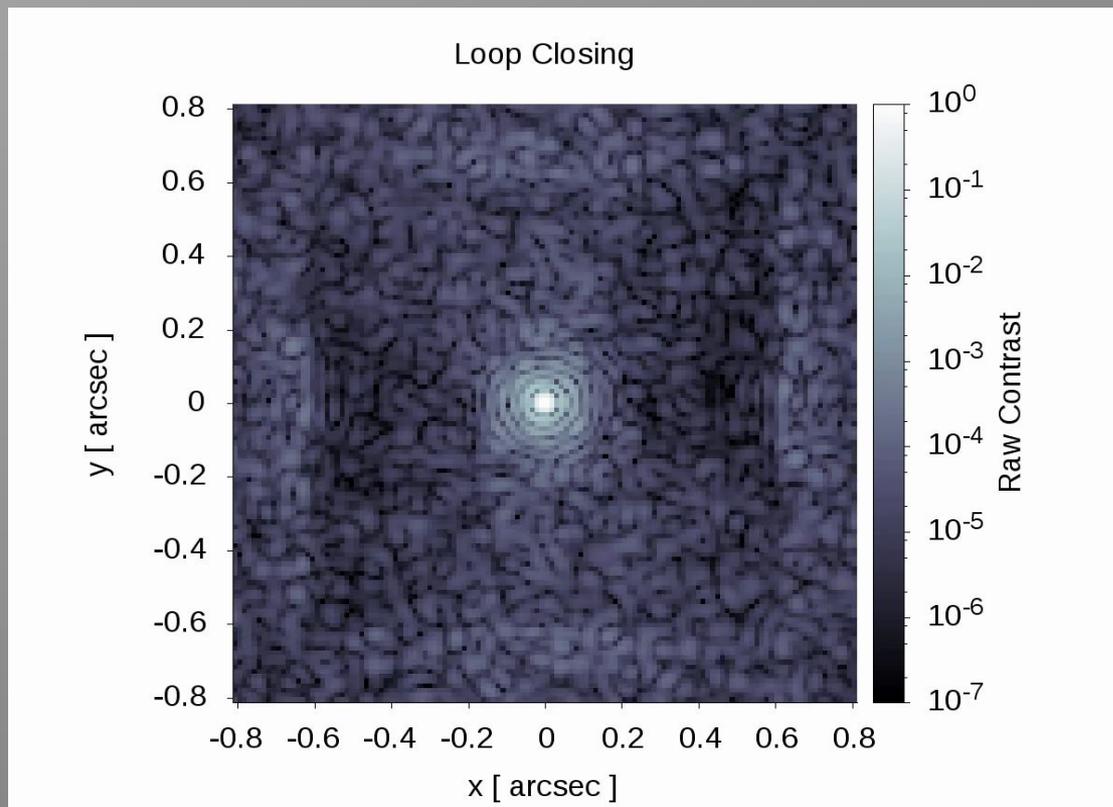


Control Law

- The control law calculates the command to apply to the DM based on the WFS measurements.
 - Simple Integrator: $\tilde{h}_i = \tilde{h}_{i-1} + g\Delta h_i$
 - General Integrator:
$$\tilde{h}(t_i) = \sum_{j=1}^J a_j \tilde{h}(t_{i-j}) + g \sum_{l=0}^L b_l \Delta h(t_{i-l})$$
- Choosing an optimum set of coefficients is the subject of “predictive control”, which many studies have considered.
 - E.g. Dessenne et al. (1998), Poyneer et al. (2007) , Correia et al. (2017)
- We consider a method for determining the coefficients based on the Linear Prediction (LP) formalism using the input PSD.
 - See Males & Guyon (2018) for details . . .

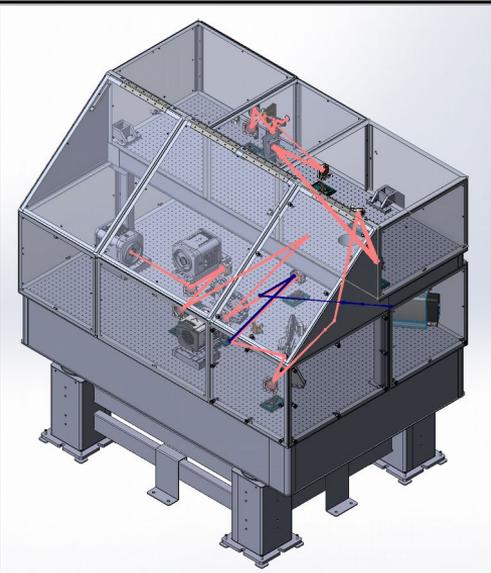


Predictive Control In Action





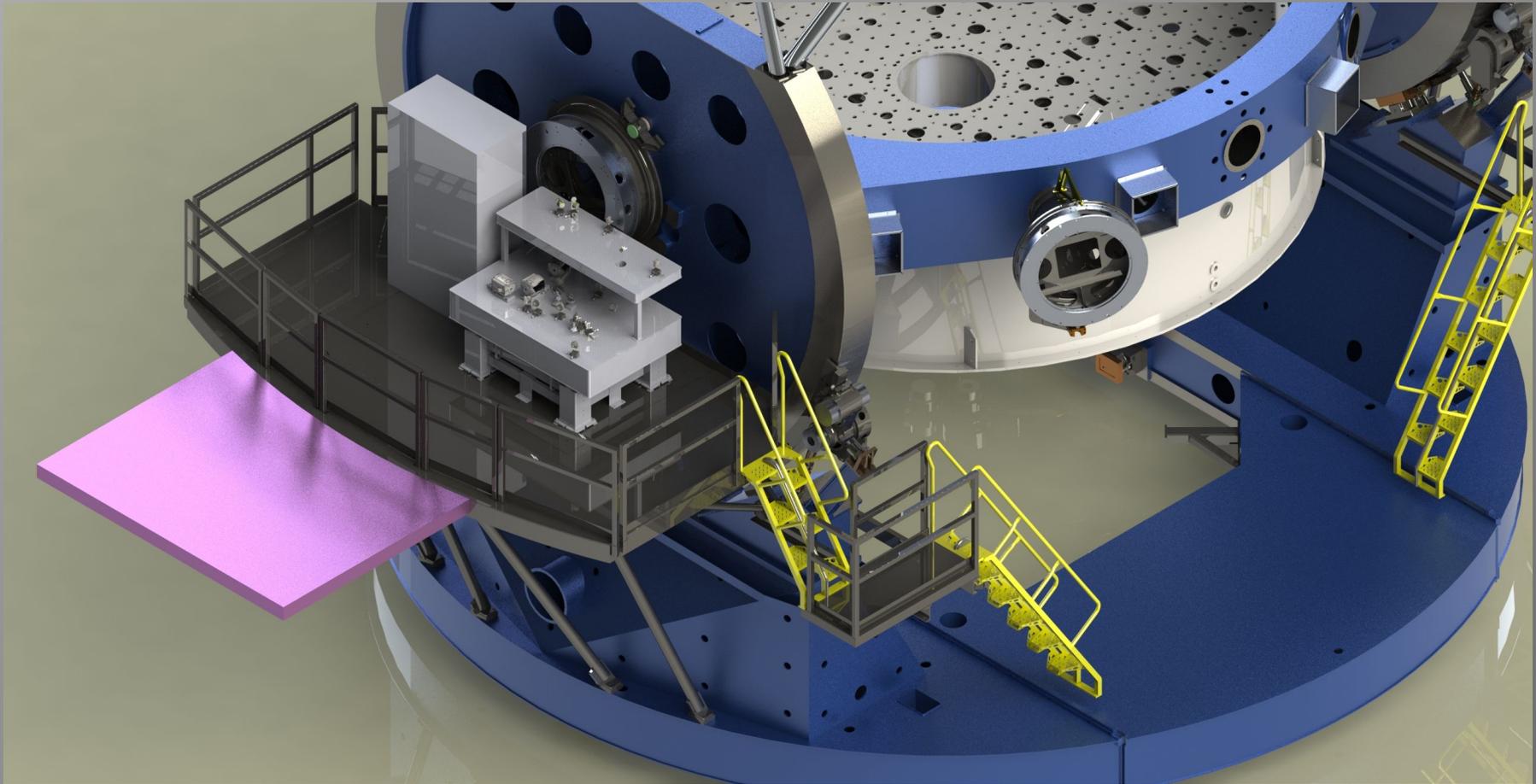
MagAO-X



- NSF-MRI funded ExAO+Coronagraph
 - 2000 actuator BMC MEMS
 - 3.7 kHz Pyramid WFS
 - Suite of coronagraphs
 - vAPP (Leiden)
 - PIAACMC
 - Optimized for Vis-Near-IR
 - Young planets at $H\alpha$
- Integration in progress at UA
 - First-light spring 2019

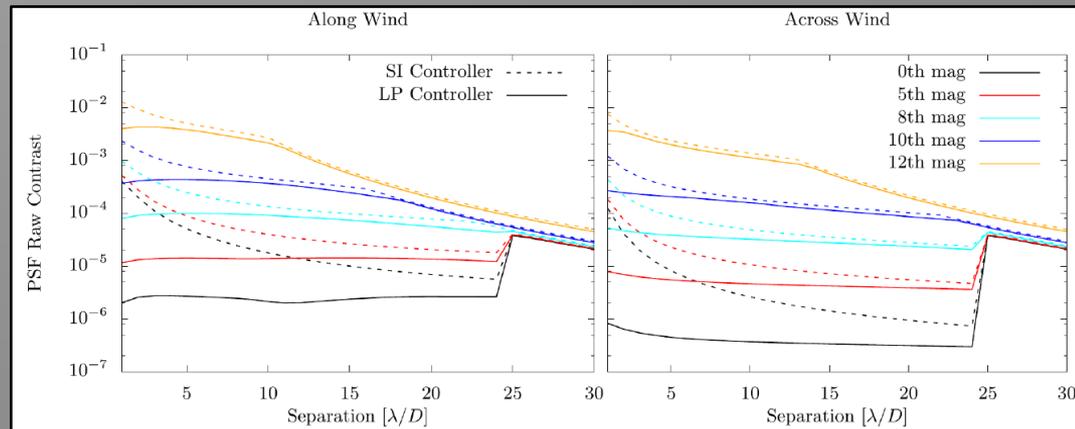
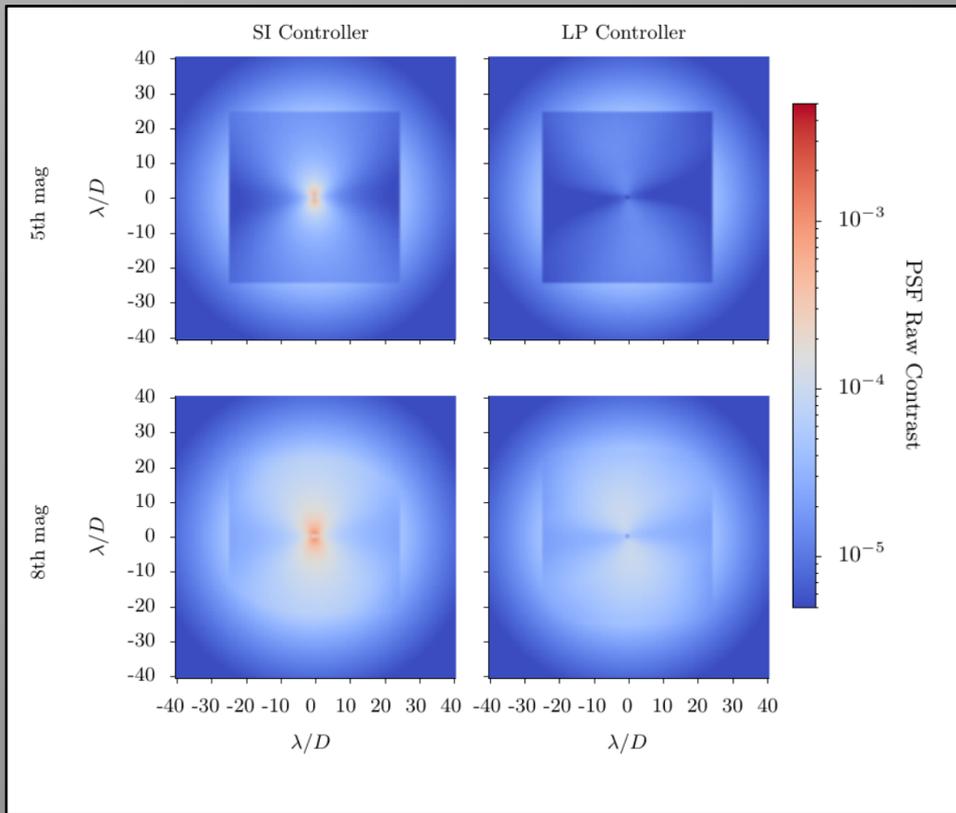


MagA0-X





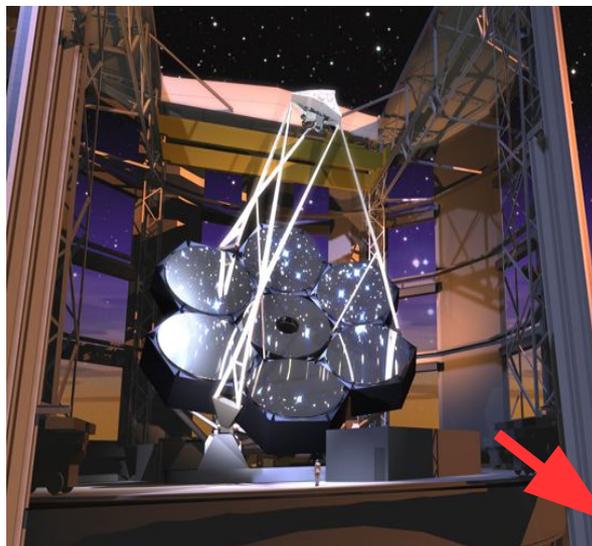
Residual Atmosphere: 6.5 m



Contrast due to residual atmospheric speckles on a 6.5 m telescope.
see Males & Guyon, JATIS, 2018

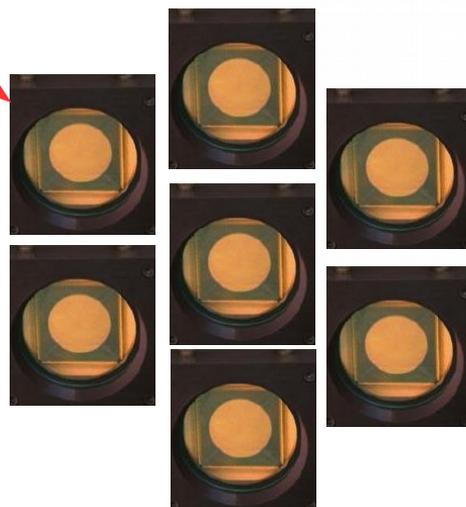


G-MagA0-X



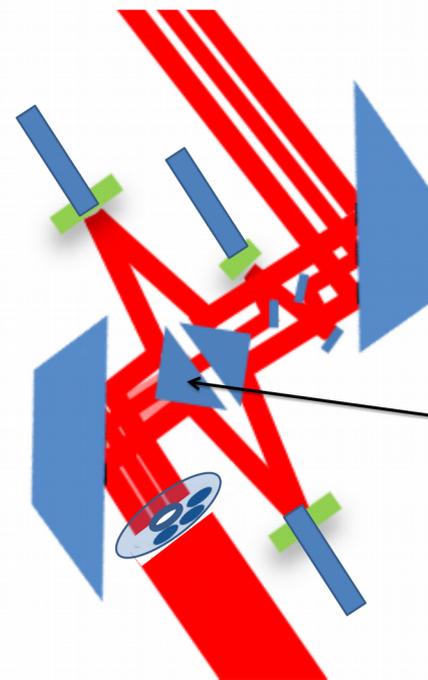
7x 3000 actuator MEMS

21,000 Actuators

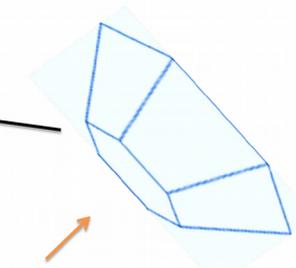


Scaling MagA0-X to the GMT

Pezzo Mirror Tip Tilt and piston



All pupils are exactly at the green planes and have the same path-length and pitch. After a second such relay the output pupil will be identical to the input pupil (SINE condition obeyed)

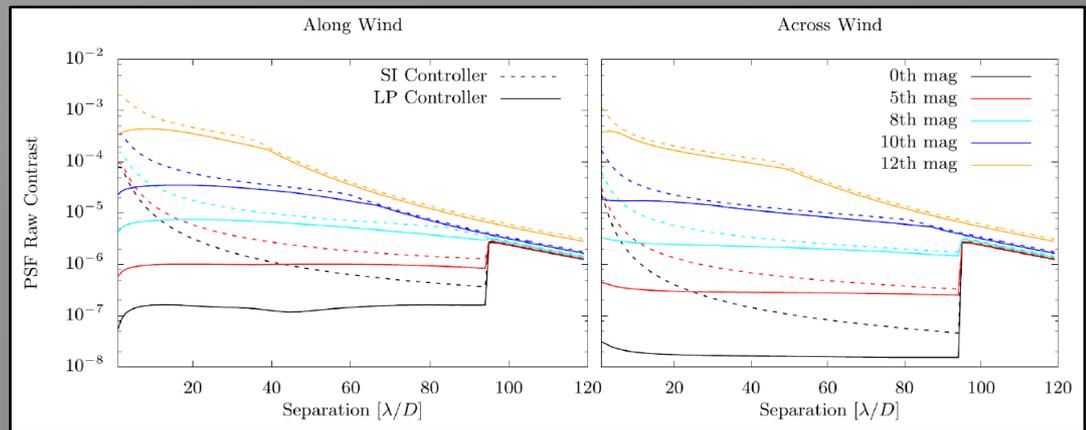
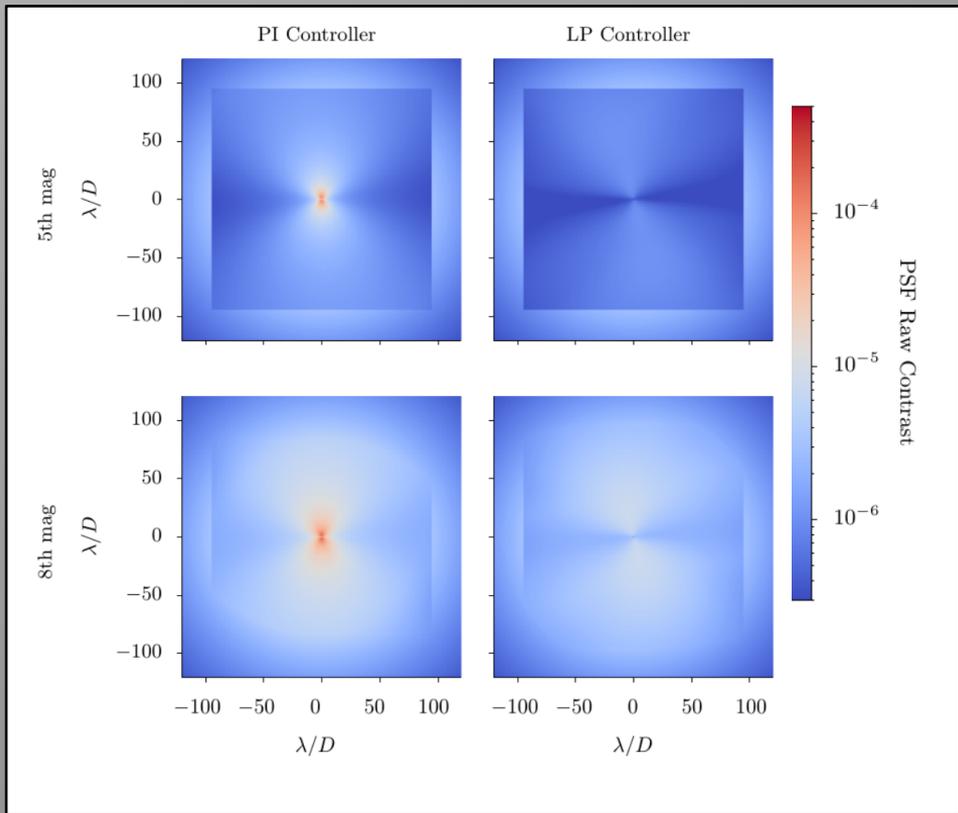


Central segment light goes through hollow center

OptoMech conceptual design by L. Close



Residual Atmosphere: 25.4 m

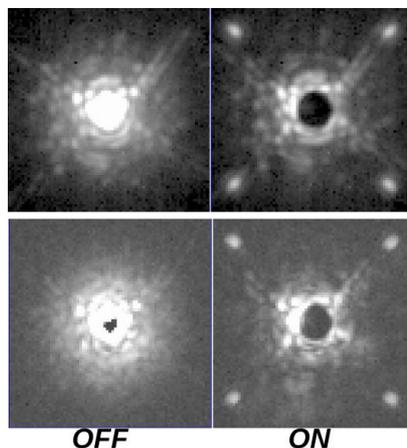


Contrast due to residual atmospheric speckles on a 25.4 m telescope.
see Males & Guyon, JATIS, 2018



How To Actually Do Predictive Control

- Make use of all available information – Sensor Fusion
 - Not just WFS
 - Accelerometers, FPWFS, etc.
- Empirical Orthogonal Functions (EOF)
 - A time-and-space PCA of all available information
 - Going back in time
 - See Guyon & Males 2017.



On sky proof of concept:
Guyon et al., in prep
On-sky results

← *RAW*

Loop running at 2kHz, filter computed every 50sec

54 consecutive 0.5s images (26 sec exposure), 3
mn apart

Same star, same exposure time, same intensity scale

← *Std dev*

OFF = integrator, gain 20%

conditions: 1.5" seeing, ~35mph wind



Step 2: “Predict residual atmospheric speckle lifetime”



Speckle Lifetimes

- Now we're on step #2
- We'll define the statistical speckle lifetime by
 - Rate of increase of variance with time: $\sigma^2(t) = \sigma_o^2 \frac{t}{\tau}$
 - Or, equivalently, improvement in variance of the mean: $\langle |a_0|^2 \rangle = \frac{\sigma_o^2}{t/\tau}$
- Historical note: this development started with ACESat (PIs Belikov and Bendek), trying to understand the power of post-processing over very long observations.



Variance of the Mean

- Noll (1976) calc. of statistics of a process given PSD
- Used Zernikes for 2D Kolmogorov PSD
 - Variance & co-var of amplitudes
 - Variance of process after correction of N Zernike modes.

Zernike polynomials and atmospheric turbulence*

Robert J. Noll
The Perkin-Elmer Corporation, Norwalk, Connecticut 06856
 (Received 3 October 1975)

This paper discusses some general properties of Zernike polynomials, such as their Fourier transforms, integral representations, and derivatives. A Zernike representation of the Kolmogoroff spectrum of turbulence is given that provides a complete analytical description of the number of independent corrections required in a wavefront compensation system.

J. Opt. Soc. Am., Vol. 66, No. 3, March 1976

TABLE IV. Zernike-Kolmogoroff residual errors (Δ_J). (D is the aperture diameter.)

| | |
|--|--------------------------------------|
| $\Delta_1 = 1.0299 (D/r_0)^{5/3}$ | $\Delta_{12} = 0.0352 (D/r_0)^{5/3}$ |
| $\Delta_2 = 0.582 (D/r_0)^{5/3}$ | $\Delta_{13} = 0.0328 (D/r_0)^{5/3}$ |
| $\Delta_3 = 0.134 (D/r_0)^{5/3}$ | $\Delta_{14} = 0.0304 (D/r_0)^{5/3}$ |
| $\Delta_4 = 0.111 (D/r_0)^{5/3}$ | $\Delta_{15} = 0.0279 (D/r_0)^{5/3}$ |
| $\Delta_5 = 0.0880 (D/r_0)^{5/3}$ | $\Delta_{16} = 0.0267 (D/r_0)^{5/3}$ |
| $\Delta_6 = 0.0648 (D/r_0)^{5/3}$ | $\Delta_{17} = 0.0255 (D/r_0)^{5/3}$ |
| $\Delta_7 = 0.0587 (D/r_0)^{5/3}$ | $\Delta_{18} = 0.0243 (D/r_0)^{5/3}$ |
| $\Delta_8 = 0.0525 (D/r_0)^{5/3}$ | $\Delta_{19} = 0.0232 (D/r_0)^{5/3}$ |
| $\Delta_9 = 0.0463 (D/r_0)^{5/3}$ | $\Delta_{20} = 0.0220 (D/r_0)^{5/3}$ |
| $\Delta_{10} = 0.0401 (D/r_0)^{5/3}$ | $\Delta_{21} = 0.0208 (D/r_0)^{5/3}$ |
| $\Delta_{11} = 0.0377 (D/r_0)^{5/3}$ | |
| $\Delta_J \sim 0.2944 J^{-3/2} (D/r_0)^{5/3}$ (For large J) | |



Variance of the Mean

- We can repeat Noll's analysis in 1-D with Legendre polynomials.
 - Express time-series as expansion in Legendre polynomials

$$a_n = \frac{2}{T} \int_{-T/2}^{T/2} I(t) P_n \left(\frac{2}{T} t \right) dt$$

- Apply temporal PSD of process governing the time-series.
... bunch of math ...

- Derive covariance of coefficients:

$$\langle a_n^* a_{n'} \rangle = -i^n i^{n'} \frac{\sqrt{2n+1} \sqrt{2n'+1}}{2T} \int_0^\infty \frac{J_{n+\frac{1}{2}}(2\pi k) J_{n'+\frac{1}{2}}(2\pi k)}{k} \mathcal{T} \left(\frac{2}{T} k \right) dk$$

- Which gives variance of coefficient **n**:

$$\langle |a_n|^2 \rangle = \frac{2n+1}{2T} \int_0^\infty \frac{J_{n+\frac{1}{2}}^2(2\pi k)}{k} \mathcal{T} \left(\frac{2}{T} k \right) dk$$



Speckle Lifetime

- We can derive an expression for the correlation length of any process given its temporal PSD:

$$\tau = \lim_{T \rightarrow \infty} \frac{\int_0^\infty \frac{J_{\frac{1}{2}}^2(2\pi k)}{k} \mathcal{T}\left(\frac{2}{T}k\right) dk}{2 \int_0^{f_{max}} \mathcal{T}(f) df}$$

Males et al, in prep.

- Sanity check: if you plug in a white noise PSD, $\mathcal{T}(f) = \text{constant}$, you get:

$$\langle |a_0|^2 \rangle = \frac{\sigma_o^2 \Delta t}{T} = \frac{\sigma_o^2}{N}$$

Note: an alternative way to derive tau is to use the Wiener-Khinchin theorem to get the autocorrelation, and find tau as the integral of the A.C. (see Fitzgerald & Graham 2006). In practice, I've found this to be quite hard to implement with numerical PSDs.



Speckle Lifetime

- Getting to speckle intensity from Fourier amplitude

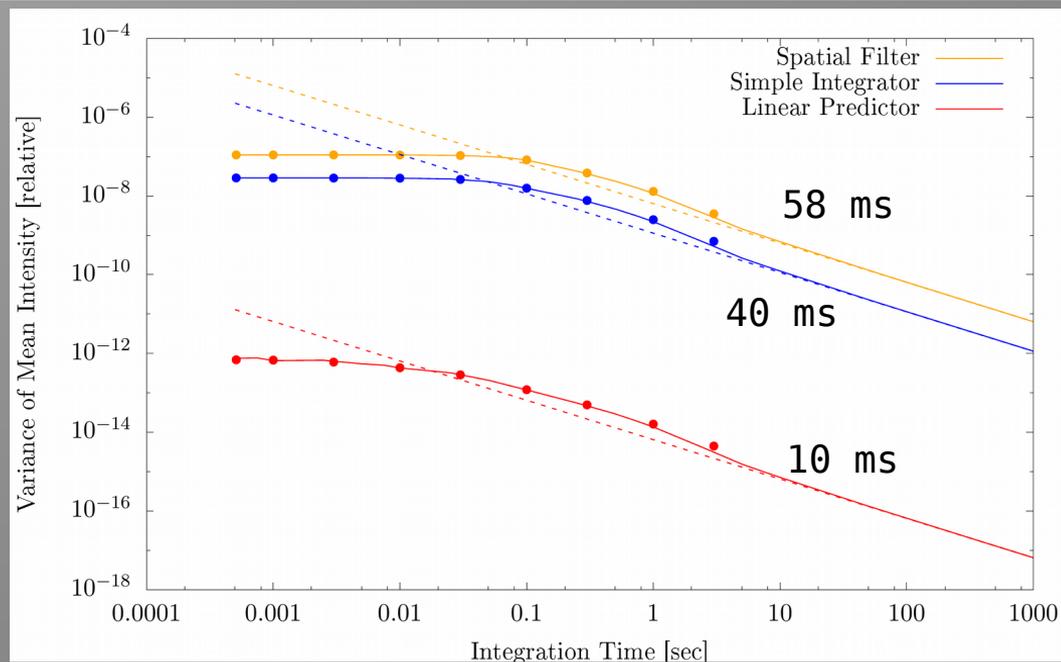
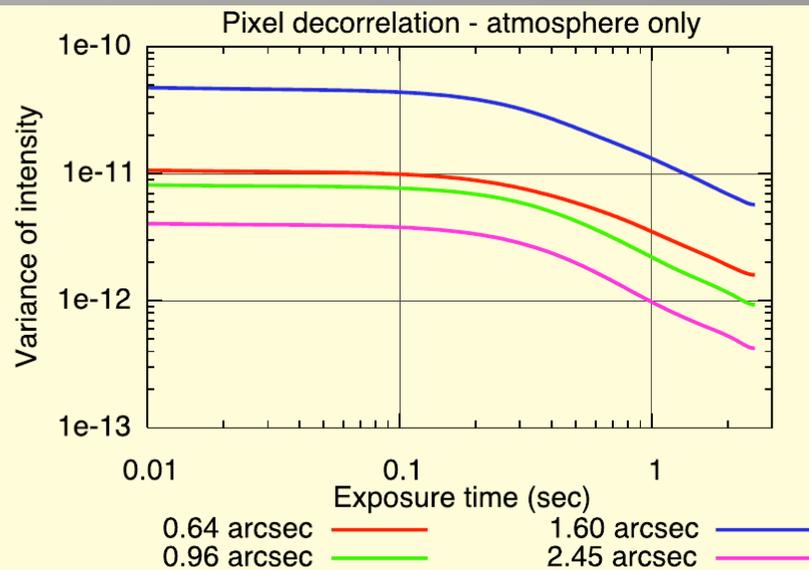
$$I_s \approx 2 \left(\frac{\pi}{\lambda} \right)^2 (h_{mn}^{+2} + h_{mn}^{-2}) \left[\text{PSF}(\vec{r} - \vec{k}_{mn}\lambda) + \text{PSF}(\vec{r} + \vec{k}_{mn}\lambda) \right]$$

- From the closed-loop control analysis, we have the PSD of h , not h^2
- Brute force it:
 - 1) generate 2x random correlated time-series of h w/ closed-loop residual PSD of the Fourier mode amplitude
 - 2) calculate the periodogram: $\mathcal{T}_{I_s}(f) \propto \left| \mathcal{F} \{ h_{mn}^{+2} + h_{mn}^{-2} \} \right|^2$
 - 3) repeat N times and average



Speckle Lifetimes

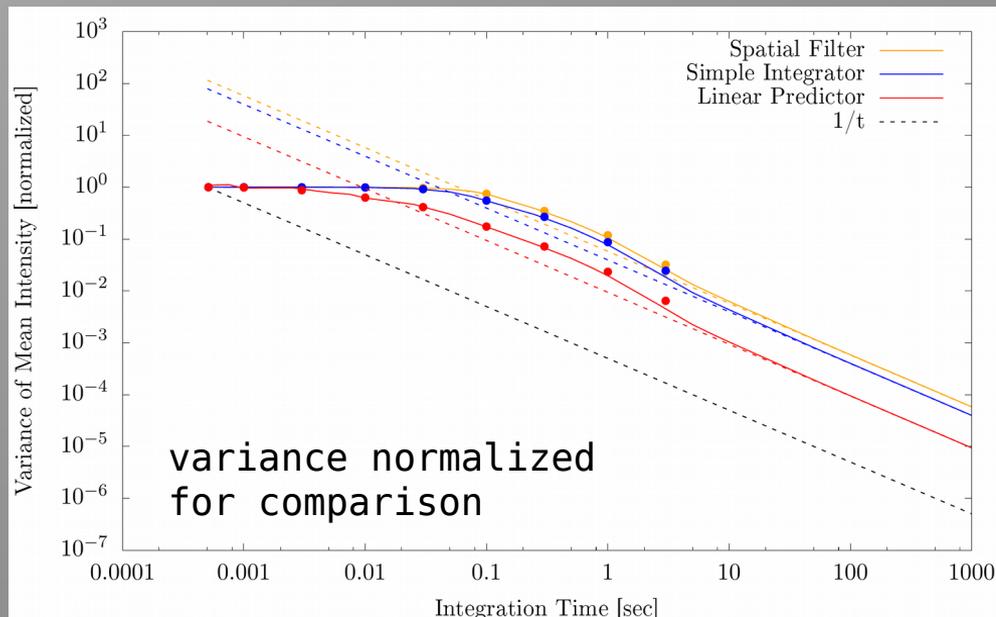
Macintosh+ 2005 (simulations):



Comparison to Macintosh et al (2005) "Crossing-Time Speckles"



Speckle Lifetimes



- Macintosh et al. (2005) ignored control dynamics (they acknowledged this)
- Concept of “crossing time speckle” is less useful with action of control law on PSDs
- Predictive Control significantly shortens speckle lifetime → faster averaging of noise (but still well above white noise)

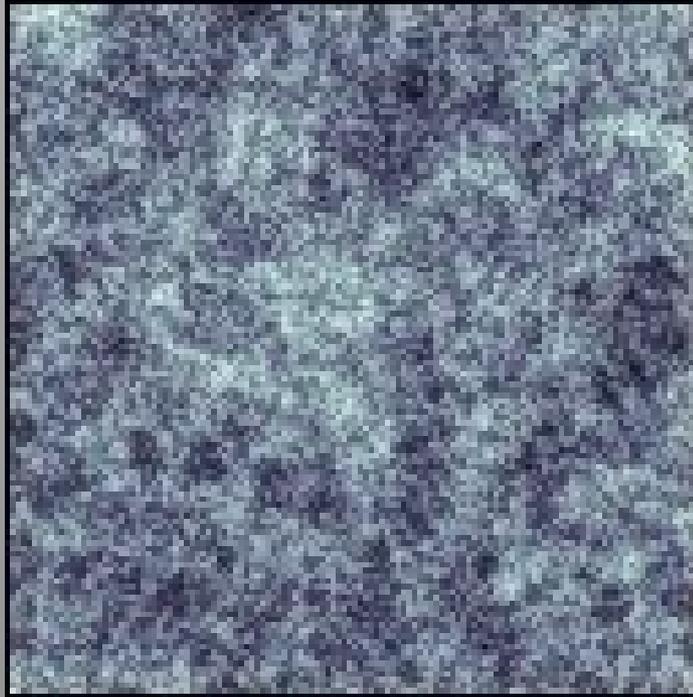


Step 3: “Predict quasi-static speckle contrast”

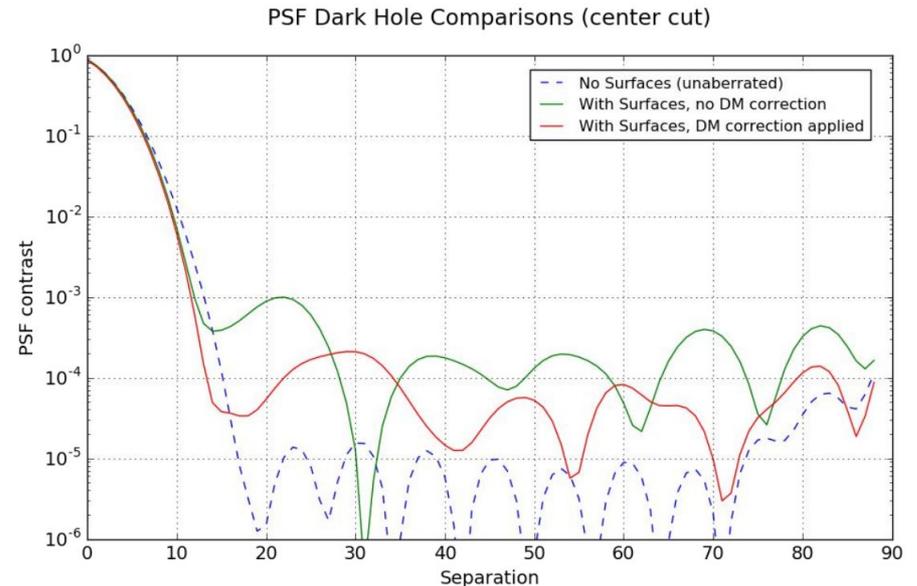
Step 4: “Predict quasi-static speckle lifetime”



Quasi-Static Speckles



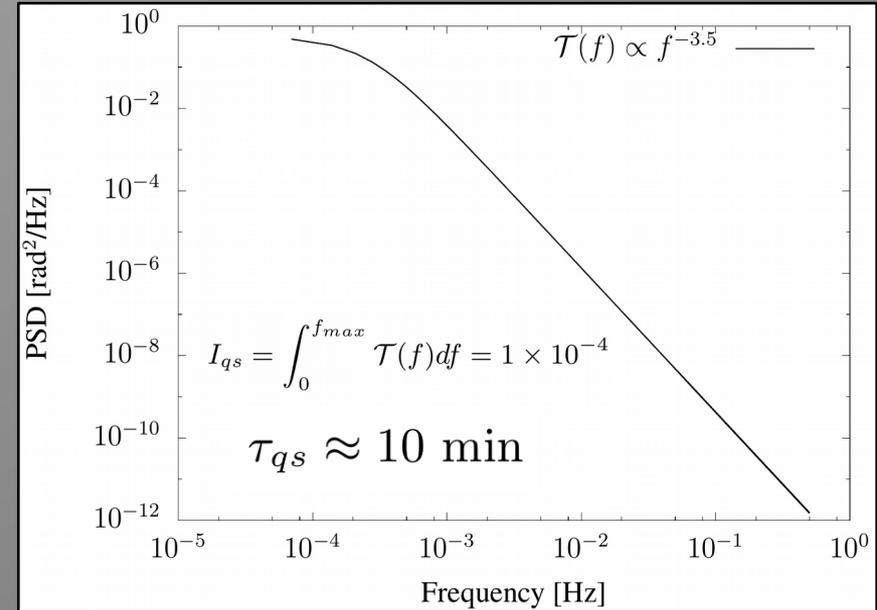
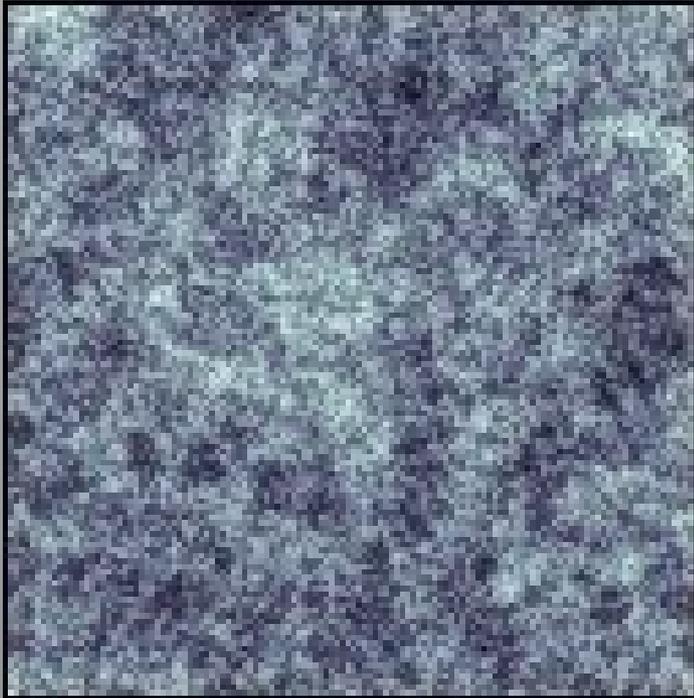
- Surface map based on MagAO-X design specs
~1e-4 raw contrast



Fresnel analysis by J. Lumbres, UofA, for MagAO-X with vAPP coronagraph (designed by David Doelman at Leiden).



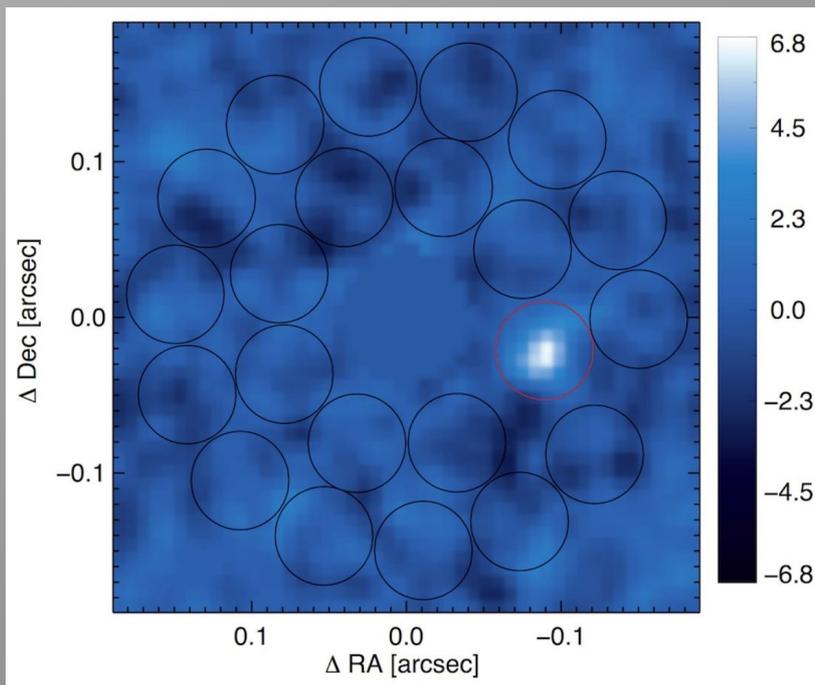
Quasi-Static Speckles



Quasi-static speckles with lifetimes of order 1 to 10 minutes commonly reported; e.g. Hinkley et al (2007), Martinez et al (2012), Milli et al (2016)



How To Take Data

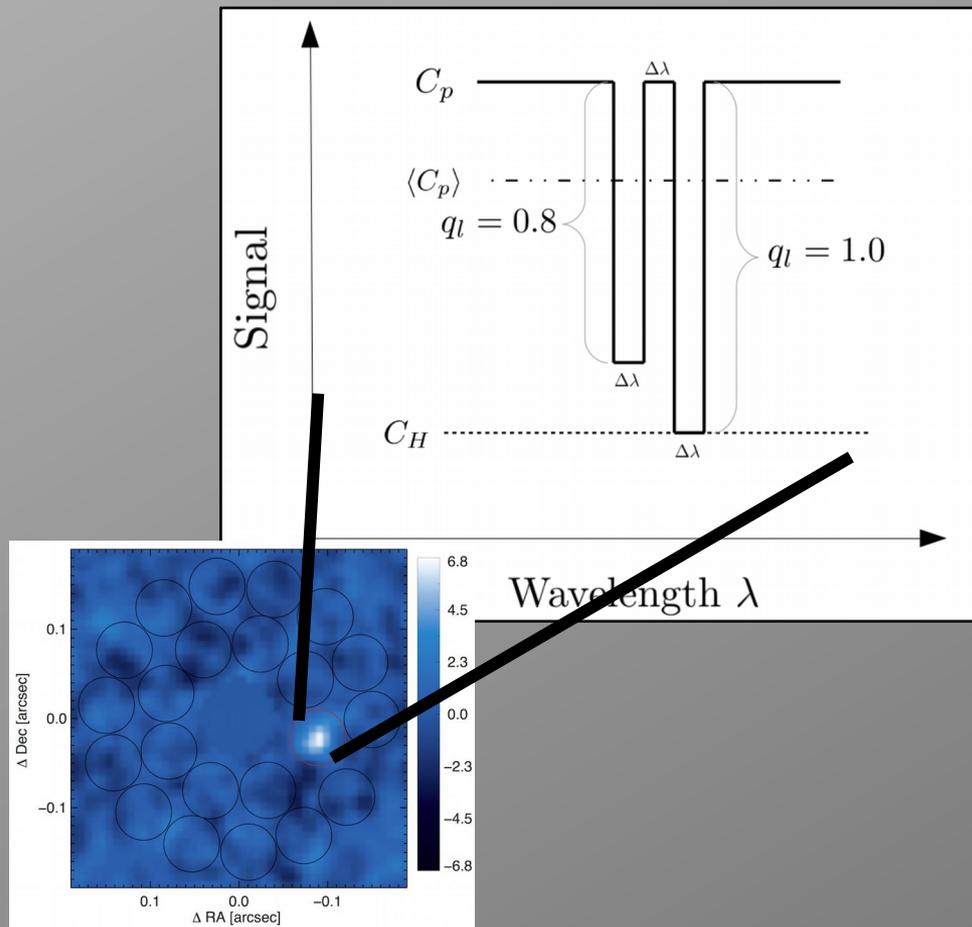


LkCa 15b at $H\alpha$ with MagAO+VisAO
Sallum et al, Nature, 2015

- Aperture Photometry
 - Measurement of background requires referencing a different spatial location \rightarrow subject to speckle noise.
- High Dispersion Coronagraphy
 - Snellen+ (2013), Mawet+ (2017), Wang+ (2017)
 - Measurement of continuum happens in-situ (across very small $\Delta\lambda$) \rightarrow not subject to speckle noise



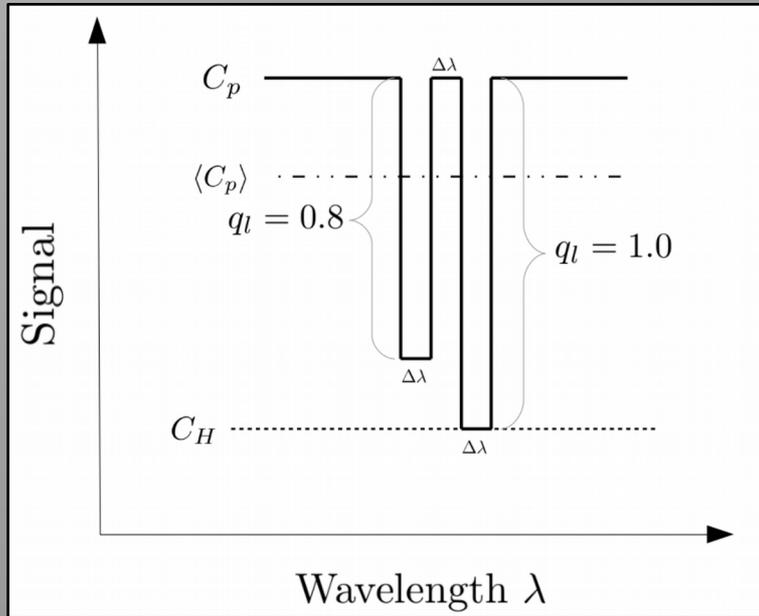
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How To Take Data



Toy model of stellar spectrum reflected by planet

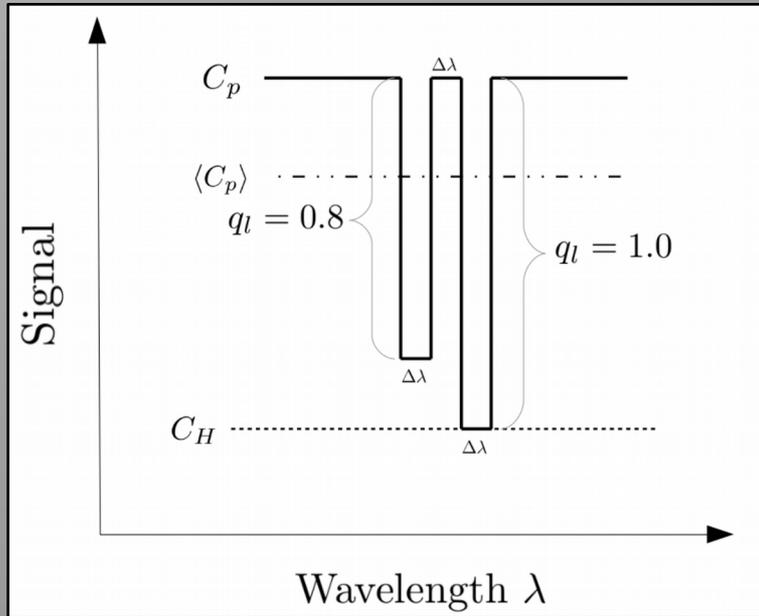
$$\frac{S/N_{HDC}}{S/N_{AP}} = \frac{\sqrt{\eta_{sp}}}{\left[1 - \frac{\Delta\lambda}{W_\lambda} \sum N_l q_l\right]} \times \sqrt{\frac{\Delta\lambda N_{l,eff}}{W_\lambda}} \times \sqrt{1 + C_H F_* W_\lambda \tau_{sl}}$$

Comparison of S/N for the HDC vs AP techniques.
If this ratio is > 1 then we should do HDC.

Males et al., in prep



How To Take Data



$$\frac{S/N_{HDC}}{S/N_{AP}} = \frac{\sqrt{\eta_{sp}}}{\left[1 - \frac{\Delta\lambda}{W_\lambda} \sum^{N_l} q_l\right]} \times \sqrt{\frac{\Delta\lambda N_{l,eff}}{W_\lambda}} \times \sqrt{1 + C_H F_* W_\lambda \tau_{sl}}$$

efficiency

information content

speckle noise

Toy model of stellar spectrum reflected by planet

Males et al., in prep

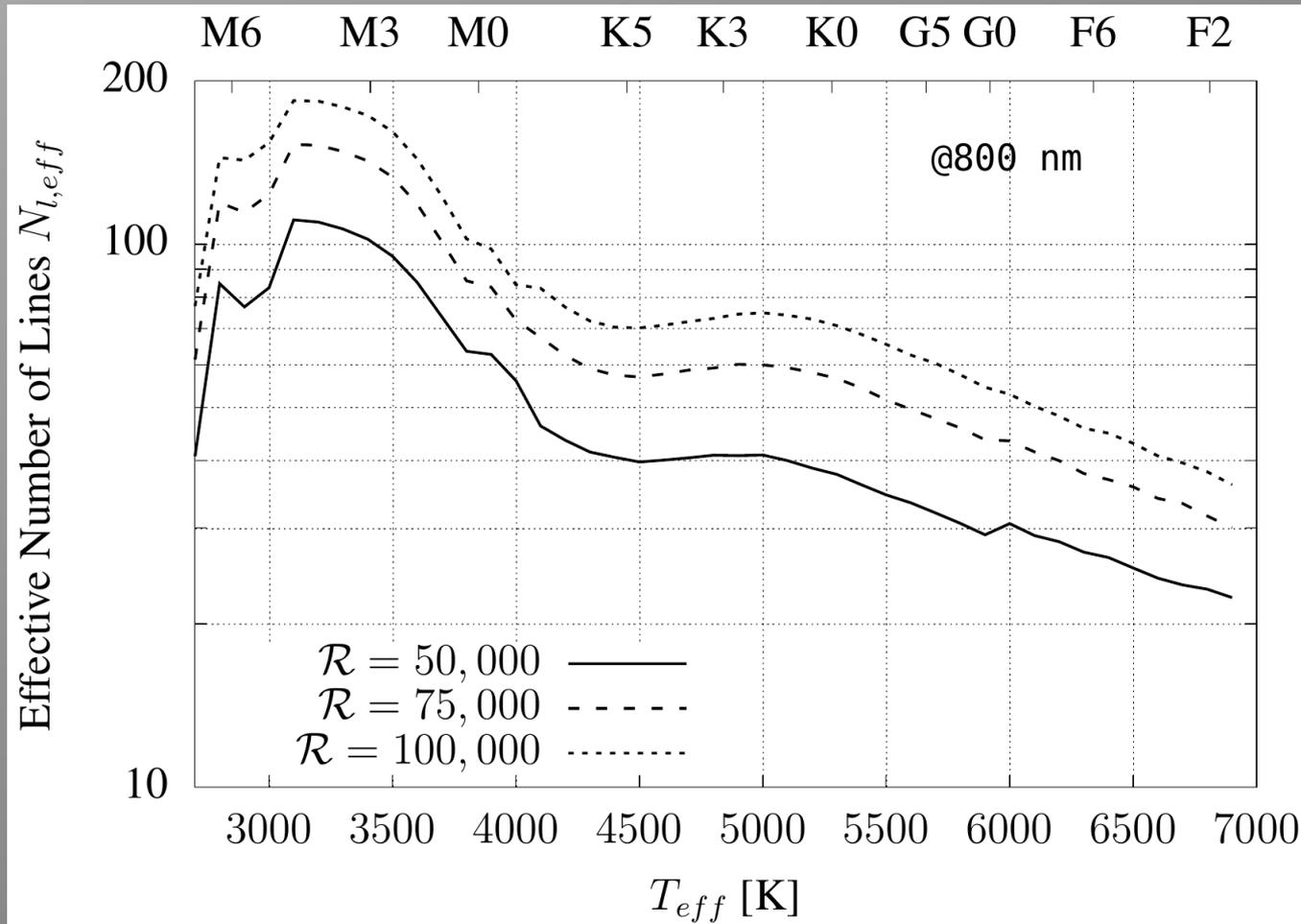


Sub-Optimal Performance \implies HDC

- Let's assume nothing works all that well:
 - Achieve only 10x the LP contrast
 - Residual is long lived speckles (~ 10 mins)
 - $3 \lambda/D$ IWA coronagraph
- And assume GMT and TMT
 - Observe known-from-RV planet hosts
 - In 25%-ile conditions for LCO and MKO
 - Science and WFS both @ 800 nm
 - 10% throughput, with noiseless detectors

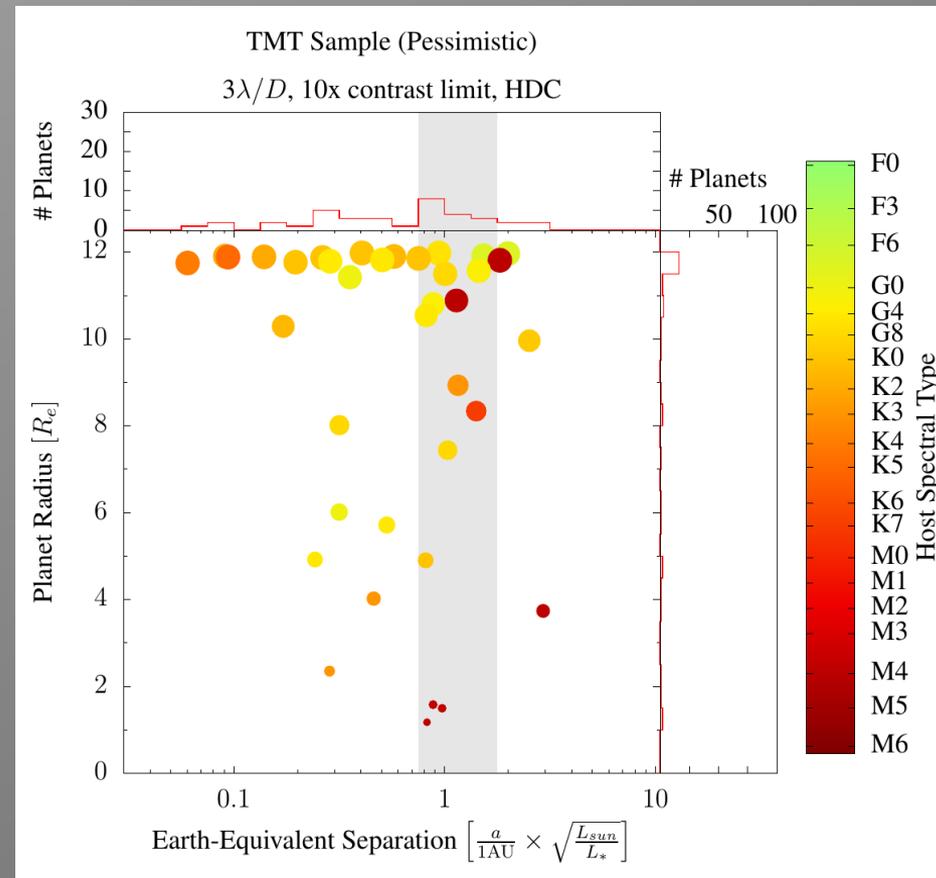
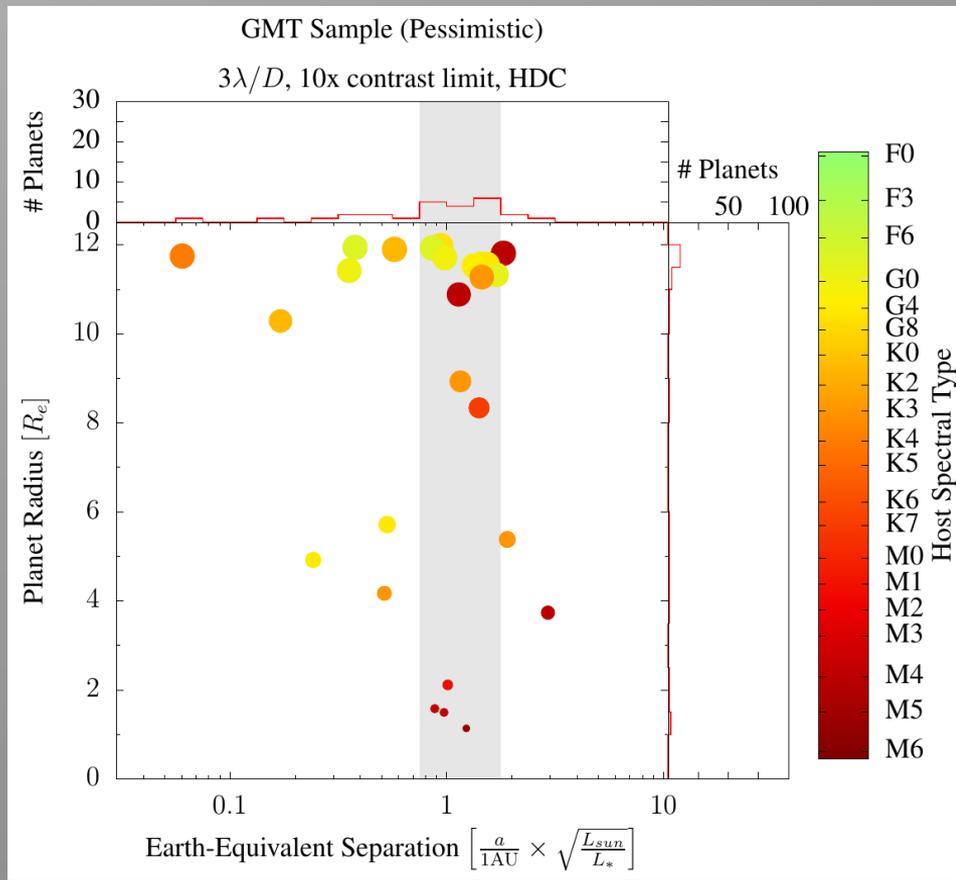


HDC w/ Reflected Stellar Lines



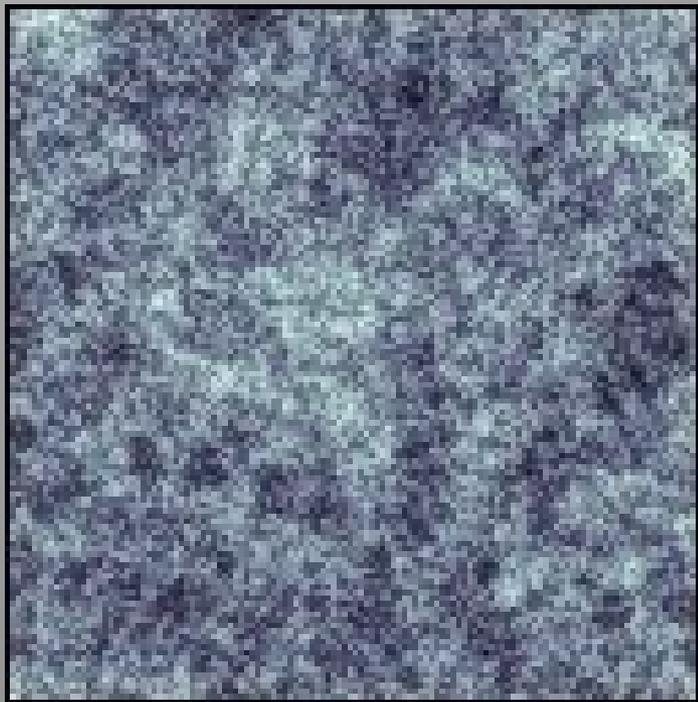


GSMT HDC Targets (reflected light albedo)





Control of Quasi-Static Speckles

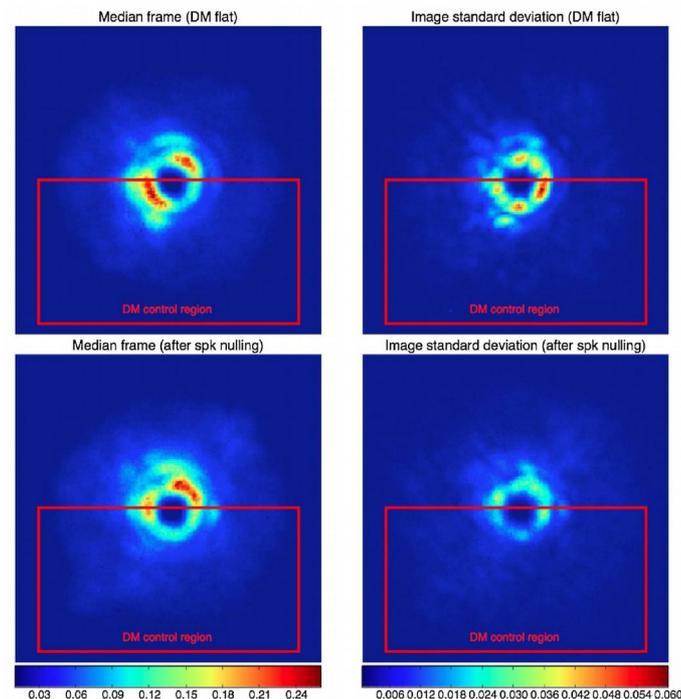


- What if we implement a 1 Hz speckle control loop?
 - Analyze it with same tools we used for atmosphere



On-line Speckle Control

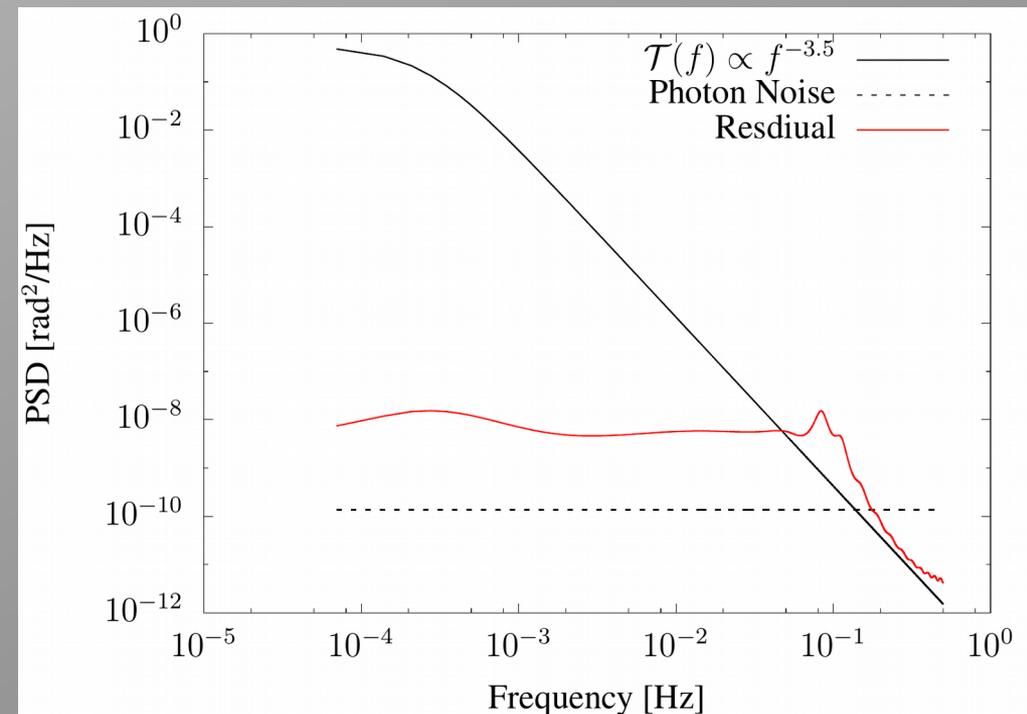
- On-line control of quasi-static speckles is not a new idea
- How fast can we run?
- Example: speckle nulling at SCExAO
 - Martinache et al (2014)
 - 30 Hz, using 30 probe frames
 - So getting to 1 Hz



On-sky demo of speckle nulling at ~ 1 Hz by Martinache et al (2014)



Control of Quasi-Static Speckles



- What if we implement a 1 Hz speckle control loop?
 - Analyze it with same tools we used for atmosphere
 - I_{qs} $1e-4 \rightarrow 1e-9$
 - τ_{qs} 10 min \rightarrow 1 sec
- Now AP will be more efficient than HDC

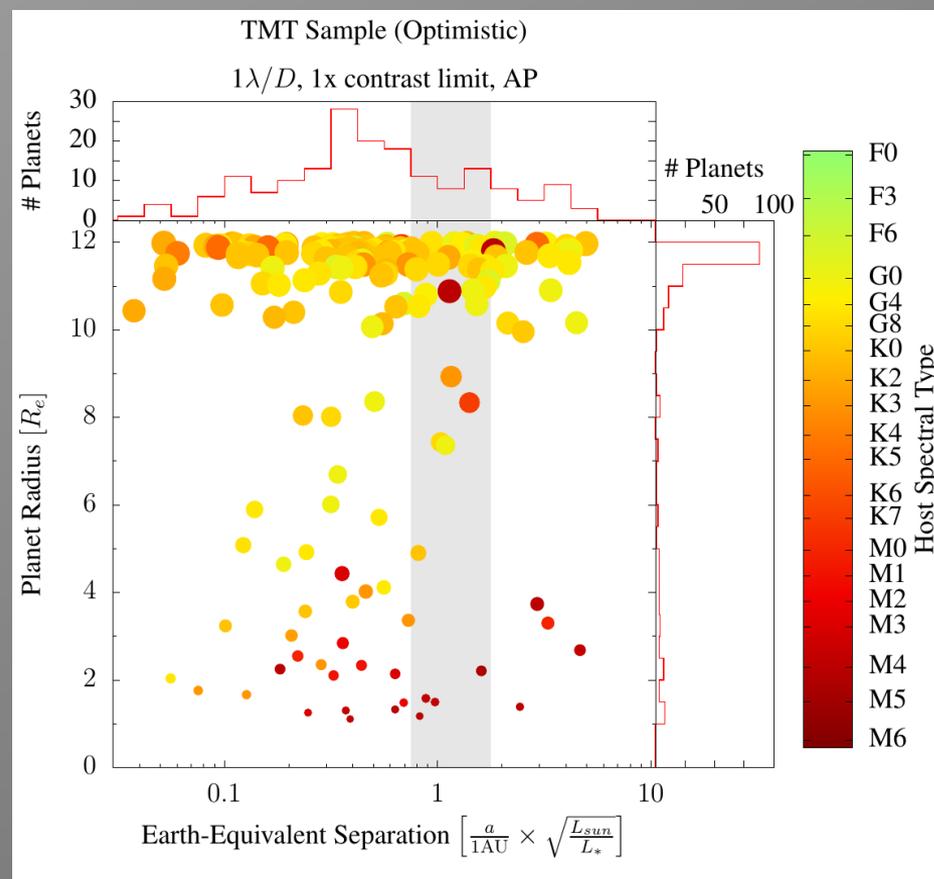
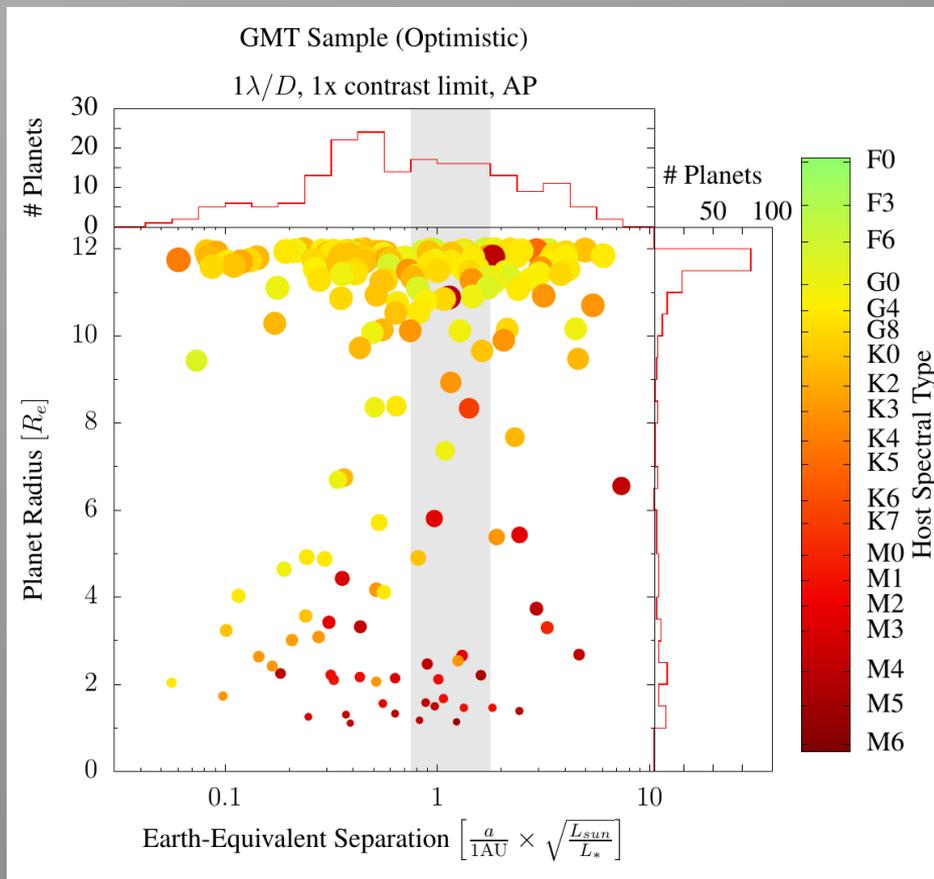


Optimal Performance \implies AP

- Let's assume it all works really well:
 - Achieve the LP contrast prediction
 - Residual is short lived speckles (10 ms)
 - $1 \lambda/D$ IWA coronagraph
- And assume GMT and TMT (same as before)
 - Observe known-from-RV planet hosts
 - In 25%-ile conditions for LCO and MKO
 - Science and WFS both @ 800 nm
 - 10% throughput, with noiseless detectors



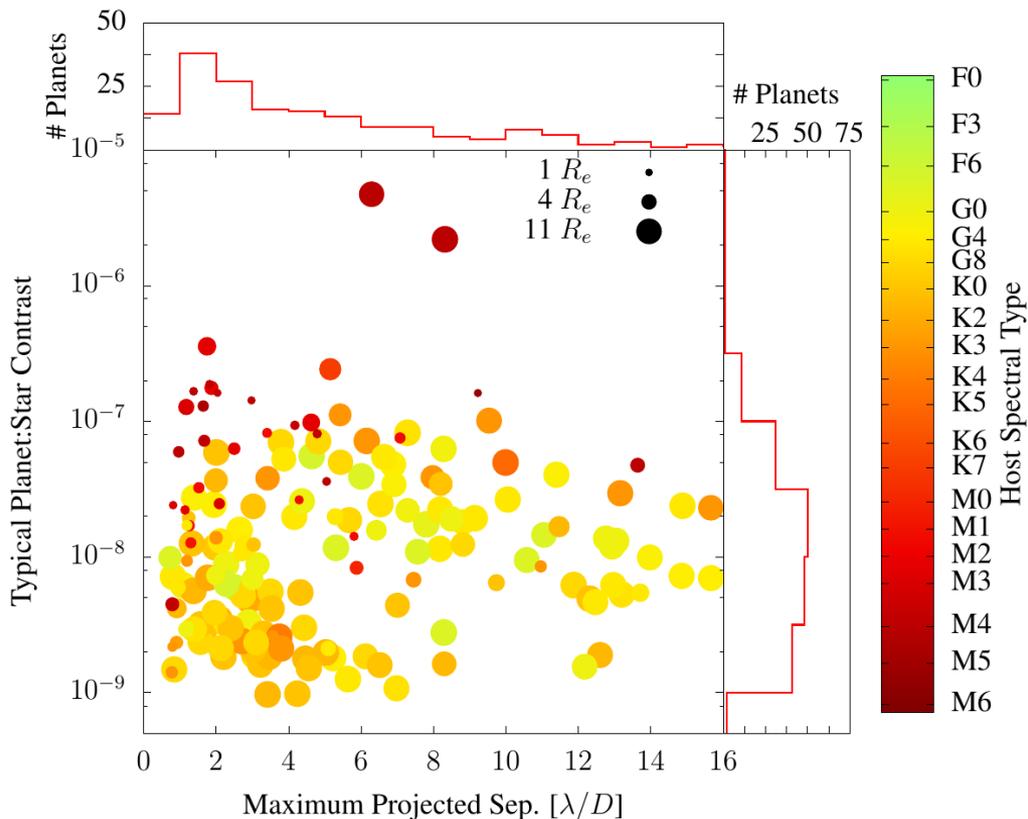
GSMT AP Targets (reflected light albedo)



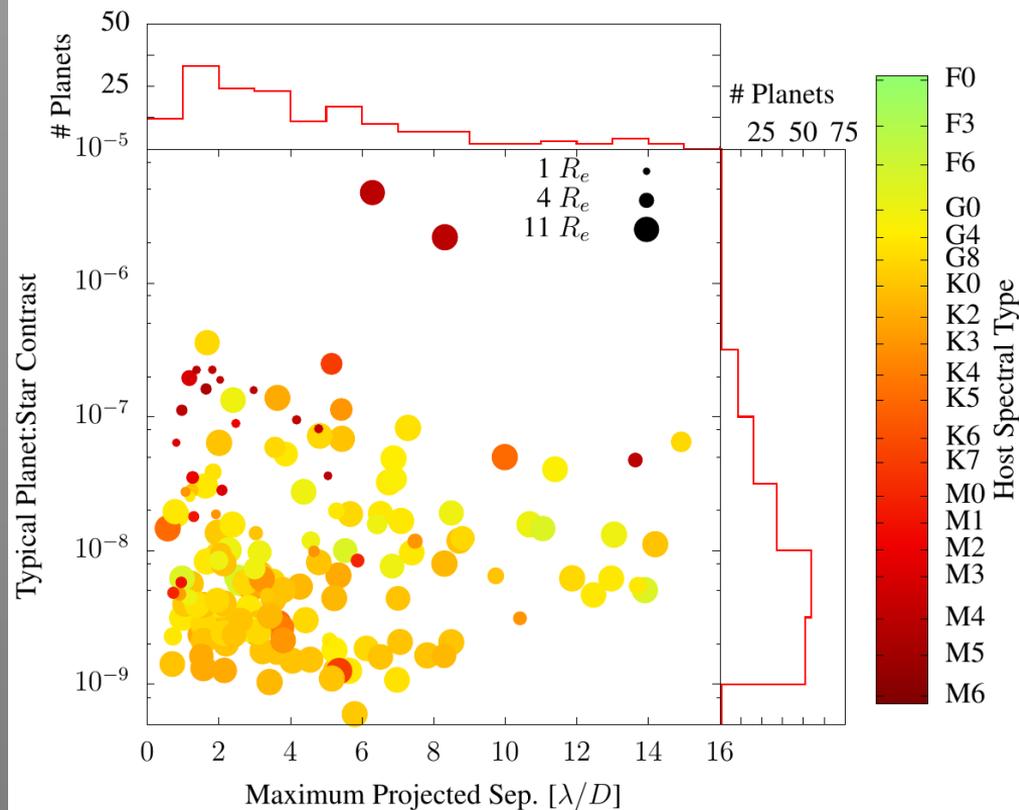


GSMT AP Targets (reflected light albedo)

GMT (CAP, 28 nights)

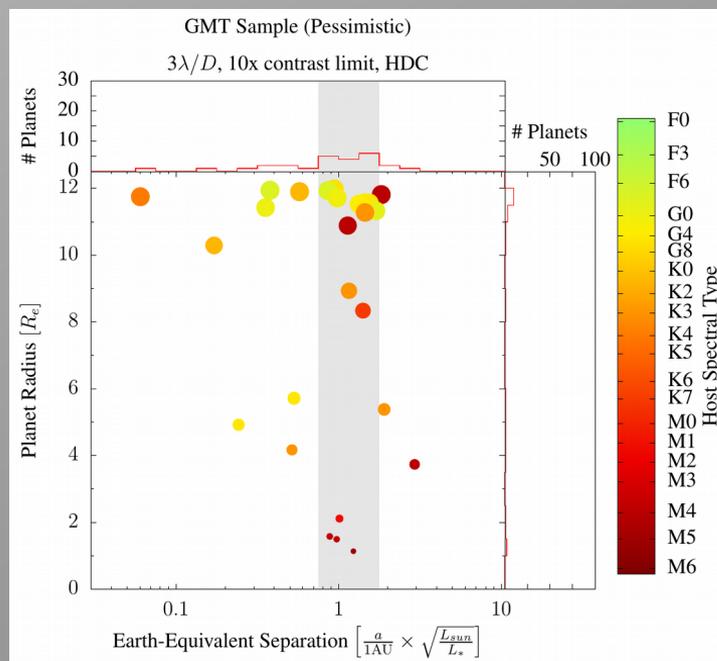


TMT (CAP, 28 nights)





What Is Our Limit On The Ground?

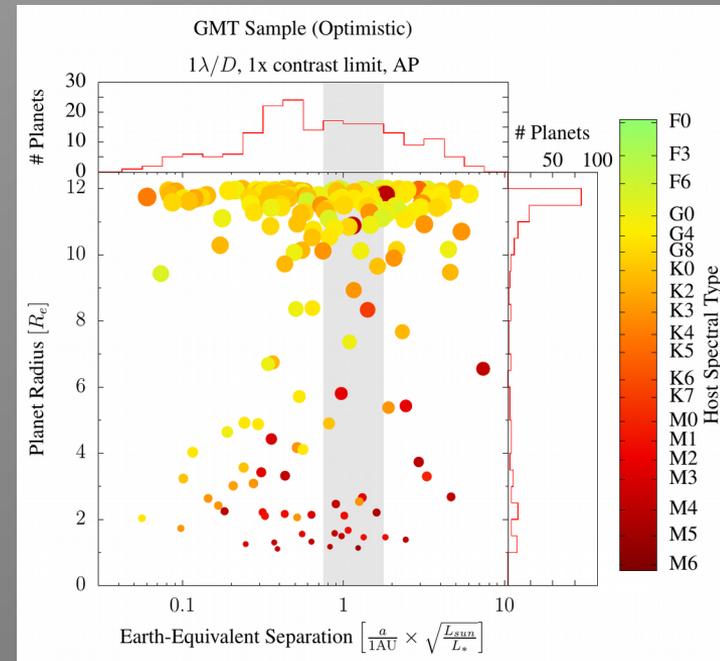


Long-lived quasi-static speckle limited \rightarrow Using HDC

Ground-based telescopes will characterize something like

\rightarrow **~40 to 300+** \leftarrow

in reflected light



Short-lived atmospheric speckle limited \rightarrow Using AP



On Post-Processing

- I have not considered Post-Processing in “fundamental” limits:

$$\sigma_{tot}^2 = F_* \Delta t \left\{ I_c + I_{as} + I_{qs} + F_* \left[\tau_{as} \left(I_{as}^2 + 2[I_c I_{as} + I_{as} I_{qs}] \right) + \tau_{qs} \left(I_{qs}^2 + 2I_c I_{qs} \right) \right] \right\}$$

P.P. will only remove the long-lived terms – much better to remove I_{qs} before taking our images

- But, for long-lived speckles that we haven’t controlled, post-processing is the key to reducing their spatial variance.
- We should be able to cast the post-processing step into the temporal frequency domain as a filter.
 - See a first attempt at this in ODI (Males, Belikov, Bendek 2015).
- Any ideas on how to do this generally?



The Promise of Predictive Control

- Predictive Control offers great promise
 - Much better contrast ($>10x$ on 8th mag star, $> 1000x$ on bright stars)
 - See Correia 2017 for a different approach which reaches same conclusion
 - Significantly shortens speckle lifetime
 - But it's hard...
 - Requires excellent calibration of system
 - WFS gain (which we know is variable)
 - Subtle details of system transfer functions really matter



Future Limits

- We should be able get the atmosphere out of the way
 - GMT raw contrast (@800nm and 25% conditions):
 - $1e-7$ on 5th mag star
 - $1e-6$ on an 8th mag star
 - 5-10 ms speckle lifetimes, will average!
- Comes down to in-instrument quasi-static speckles
- Should we be talking about moving HCIT to LCO & MKO?
 - If we can achieve optimum control of the atmosphere we will only be limited by instrumental aberrations...
 - Is that level of raw contrast motivating enough?