
LABORATORY RESULTS OF A DARK HOLE MAINTENANCE ALGORITHM FOR HIGH CONTRAST IMAGING

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OVERVIEW

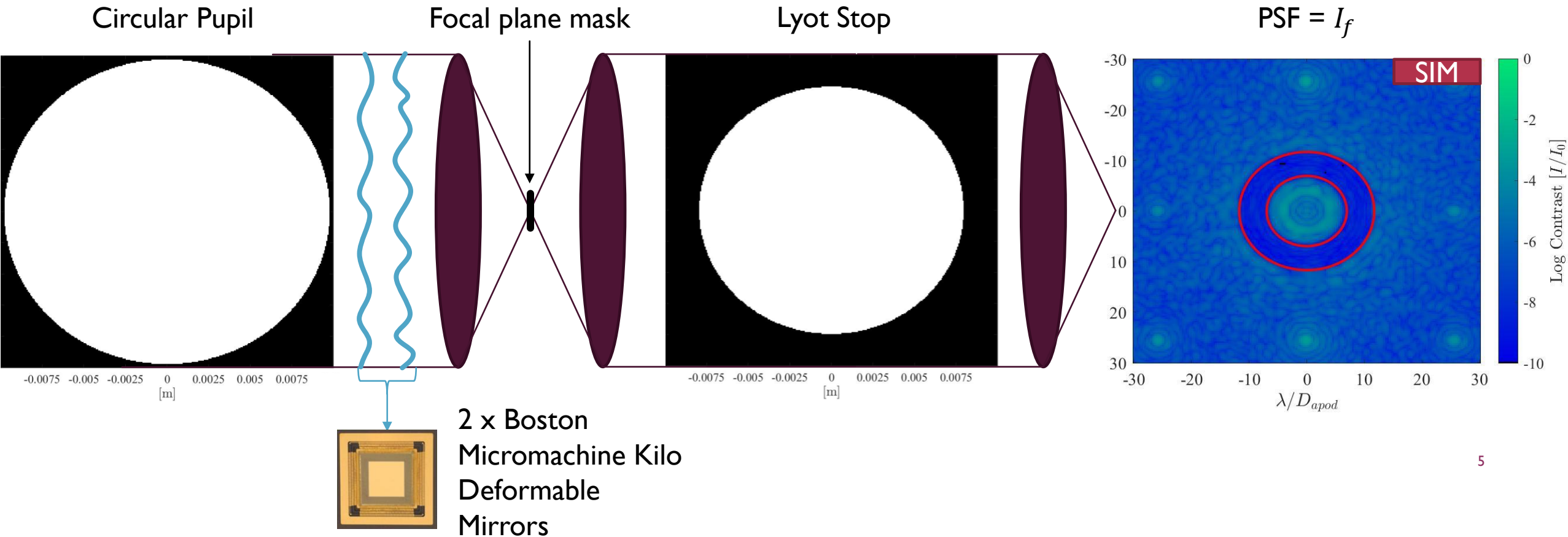
- **Background:** Direct Imaging of Exoplanets
- **Motivation:** Wavefront Error Drifts
- **Implementation:** How does the algorithm work?
- **Results:** Experiments on the High-contrast imager for Complex Aperture Telescopes (**HiCAT**) at the Space Telescope Science Institute

DIRECT IMAGING OF EXOPLANETS

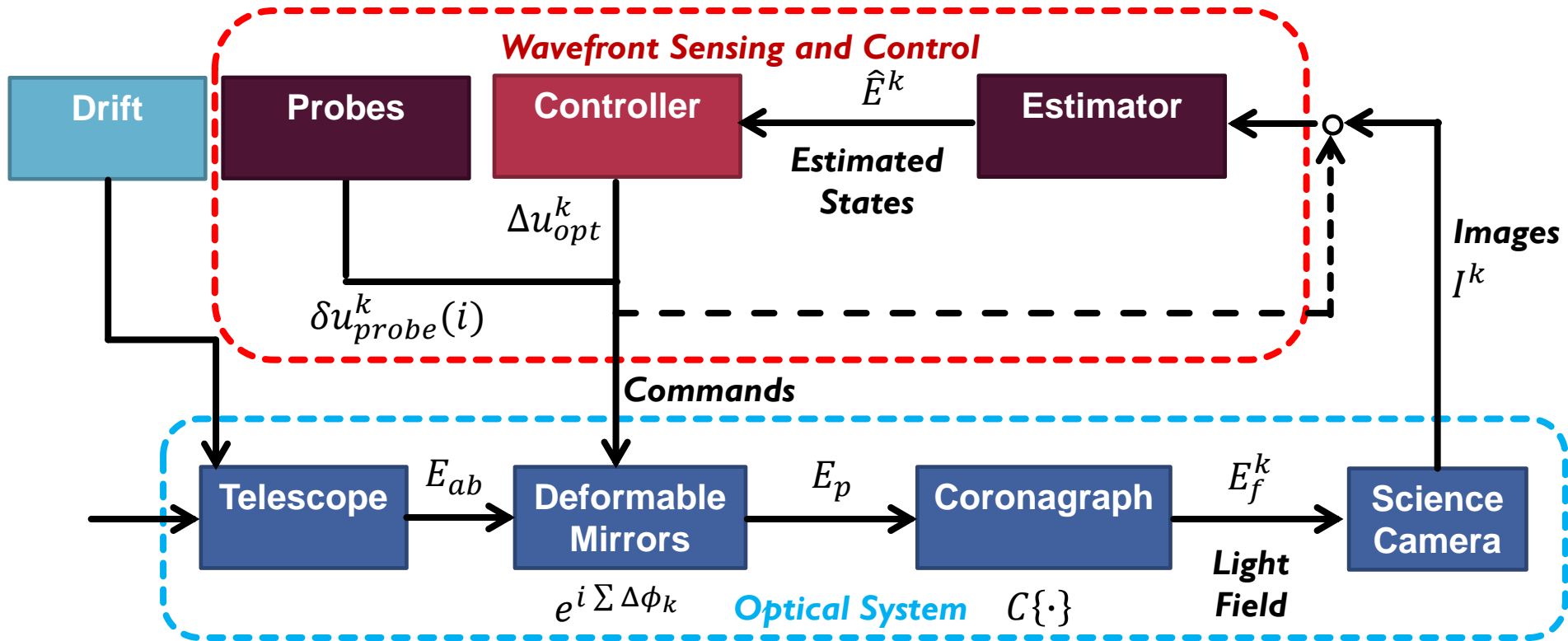
CREATING HIGH CONTRAST REGION: HICAT HARDWARE

High-contrast imager for complex aperture telescopes
Soummer 2019, Moriarty 2019

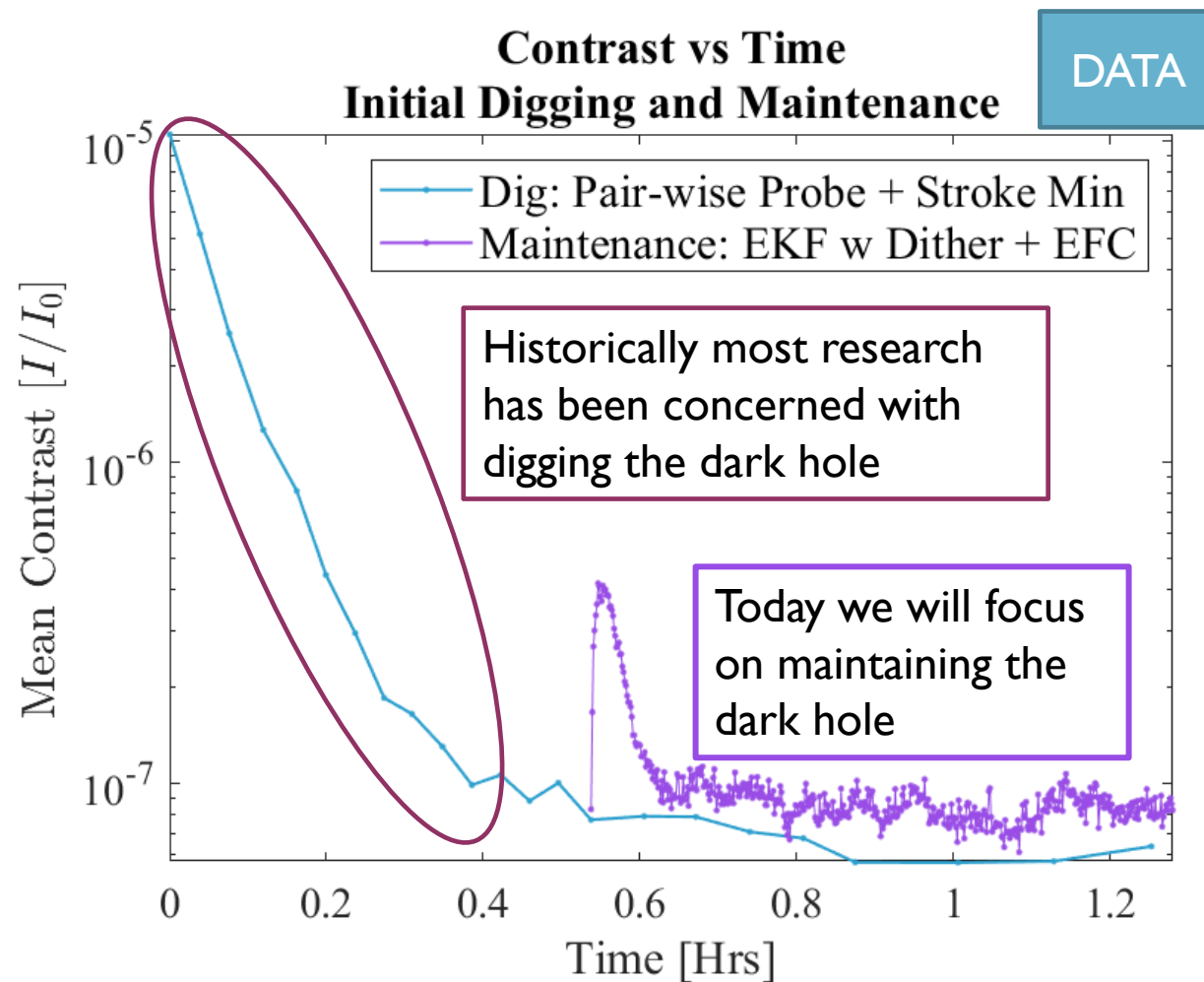
CREATING HIGH CONTRAST REGION: HICAT HARDWARE



FOCAL PLANE WAVEFRONT CONTROL (FPWC)

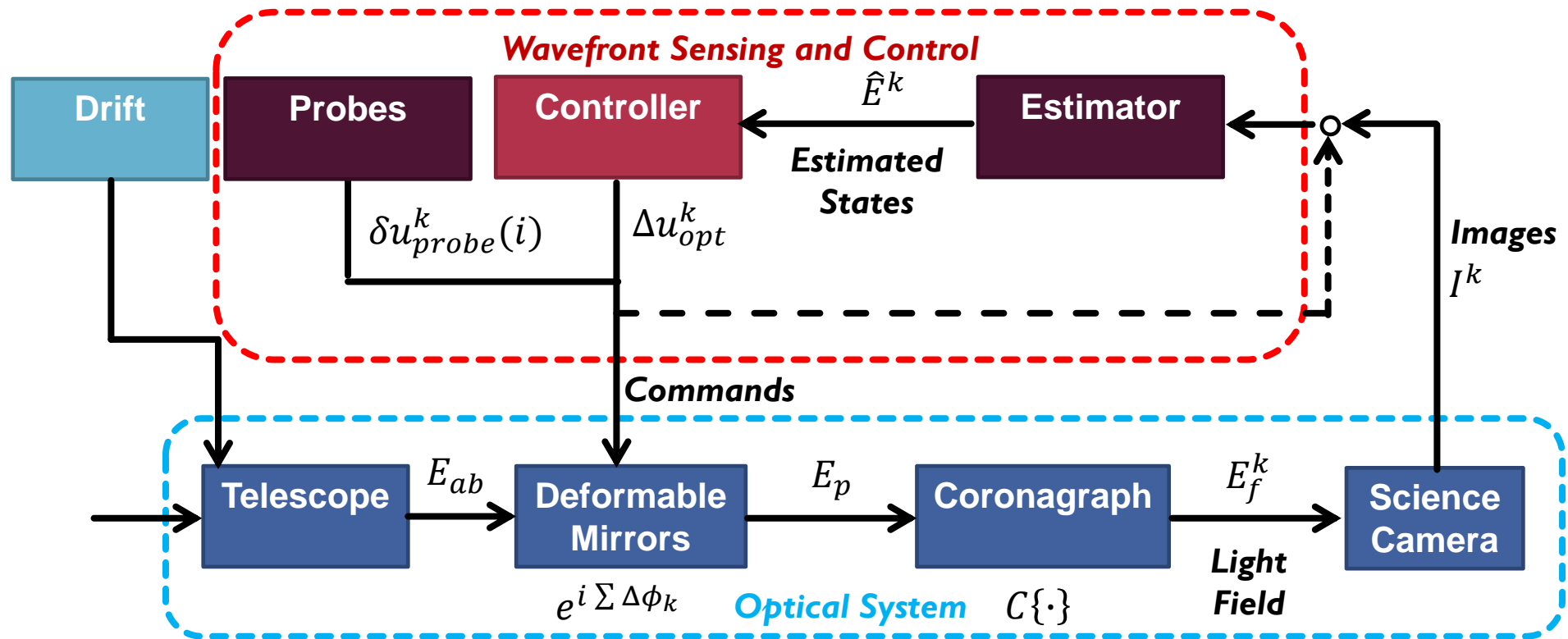


FPWC IN ACTION



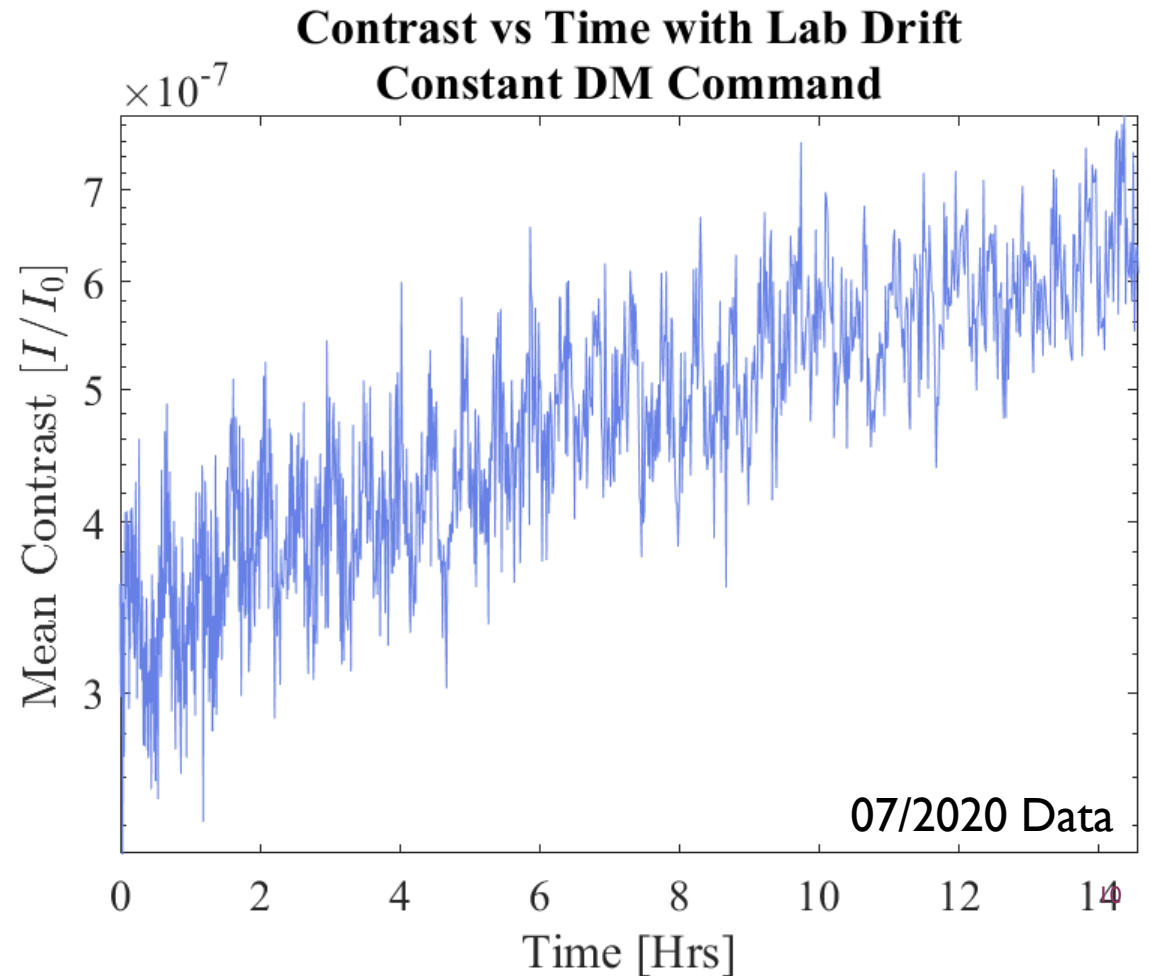
WAVEFRONT ERROR DRIFTS

SYSTEM DRIFTS

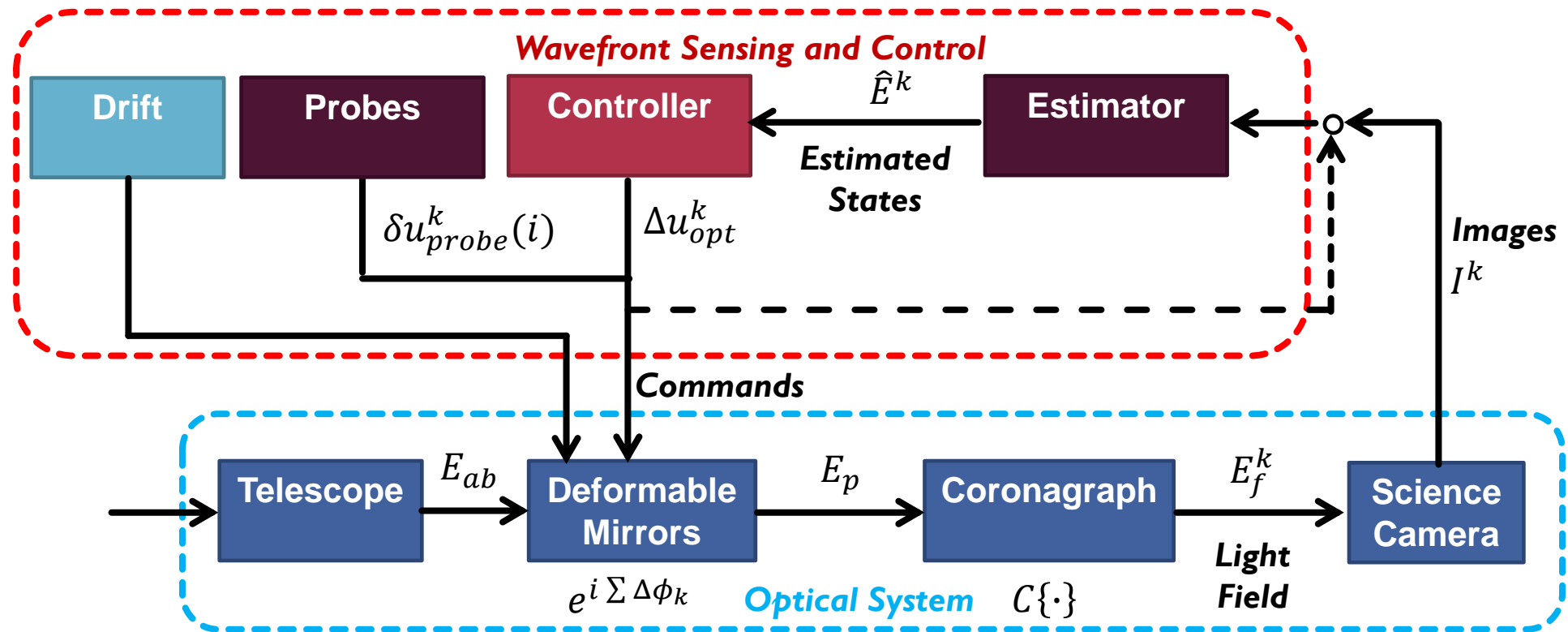


SLOW SYSTEM DRIFTS IN HICAT

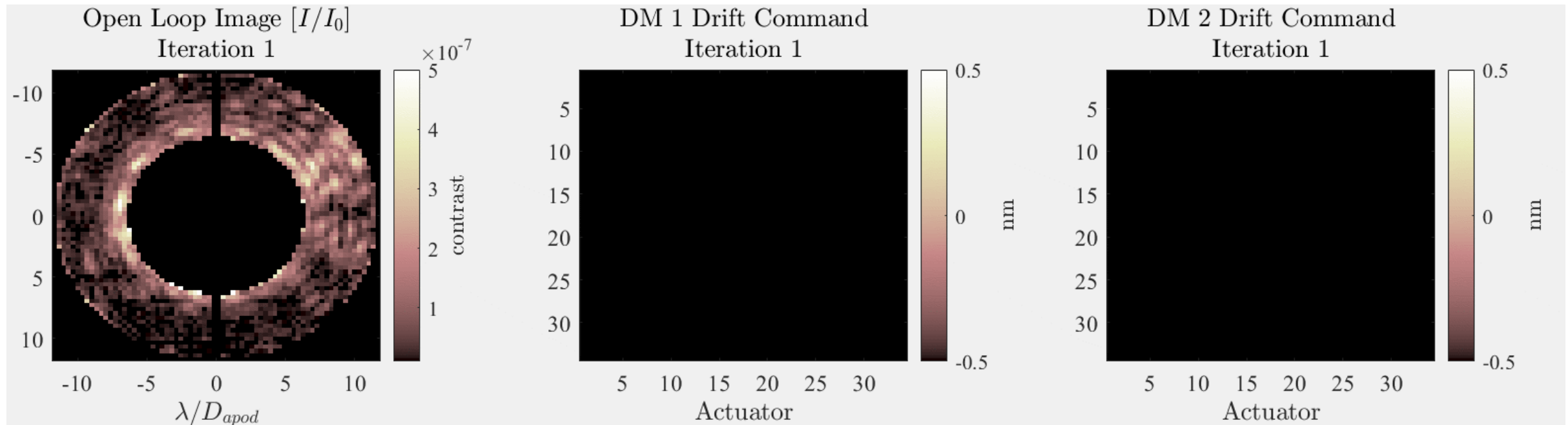
- Slow system drifts are present in every optical system
- Degradation of contrast makes detection and characterization of exoplanets more difficult
- Common causes:
 - Thermal diffusion
 - Time to reach thermal steady state
 - Thermal gradient changes
 - Changing telescope roll angle
 - Gravity (ground telescopes)
 - Change in elevation angle



MANUALLY ADDED DRIFT



DEFORMABLE MIRROR ACTUATOR RANDOM WALK DRIFT



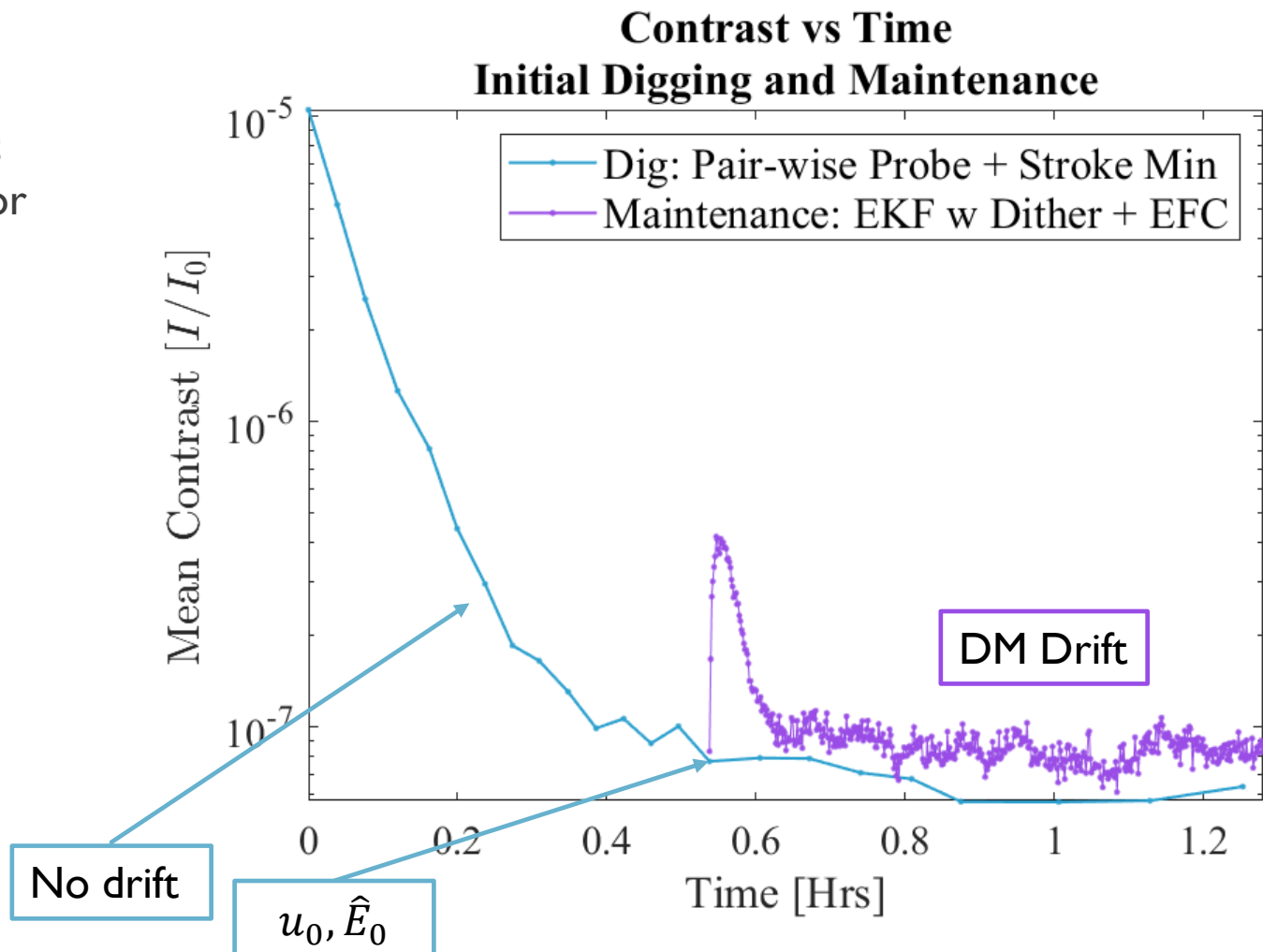
- $\mathbf{u}_{\text{open loop}}^{k+1} += \mathcal{N}(0, \sigma_{\text{drift}}^2 \mathbf{I})$
- Each actuator does a random walk with standard deviation of $\sigma_{\text{drift}} = 0.01 \text{ nm/iteration}$ starting at the final Stroke-Min DM command
- Contrast degrades by a factor of 2 in 1.5 hrs

IMPLEMENTATION OF THE DARK HOLE MAINTENANCE ALGORITHM

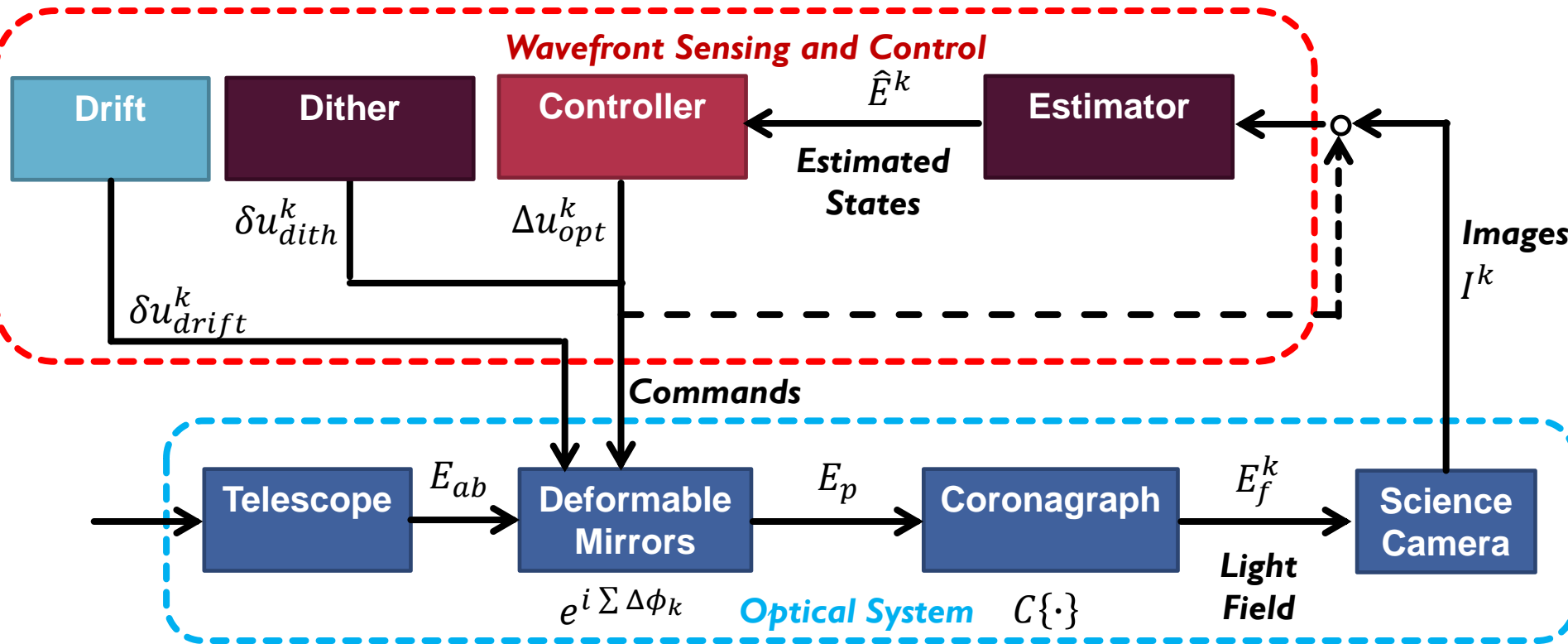
13

HIGH LEVEL MAINTENANCE PROCEDURE (POGORELYUK 2019)

- Dig dark hole
- Use final DM command (u_0) and Electric Field Estimate (\hat{E}_0) as initial conditions for maintenance algorithm
- Turn on DM random walk drift and start maintenance algorithm
- Advantages:
 - More science images
 - Easier post-processing (Pogorelyuk, 2019)
 - Can use shorter exposures



FPWC WITH DM ACTUATOR RANDOM WALK DRIFT



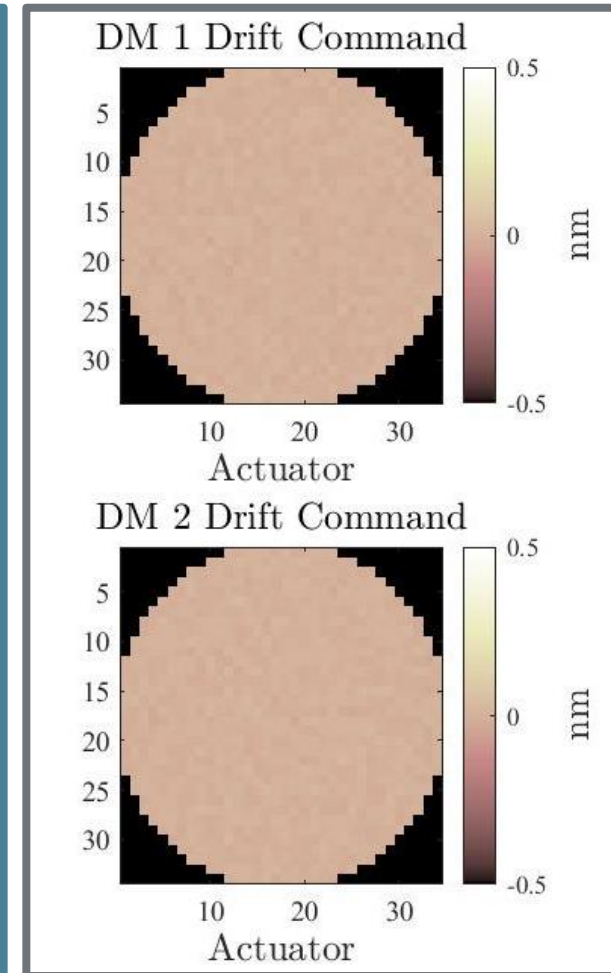
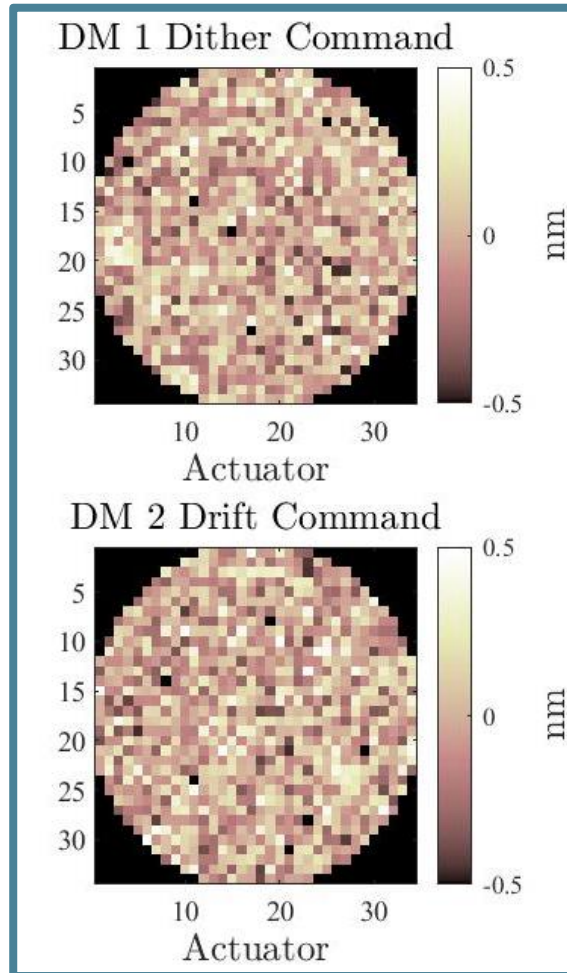
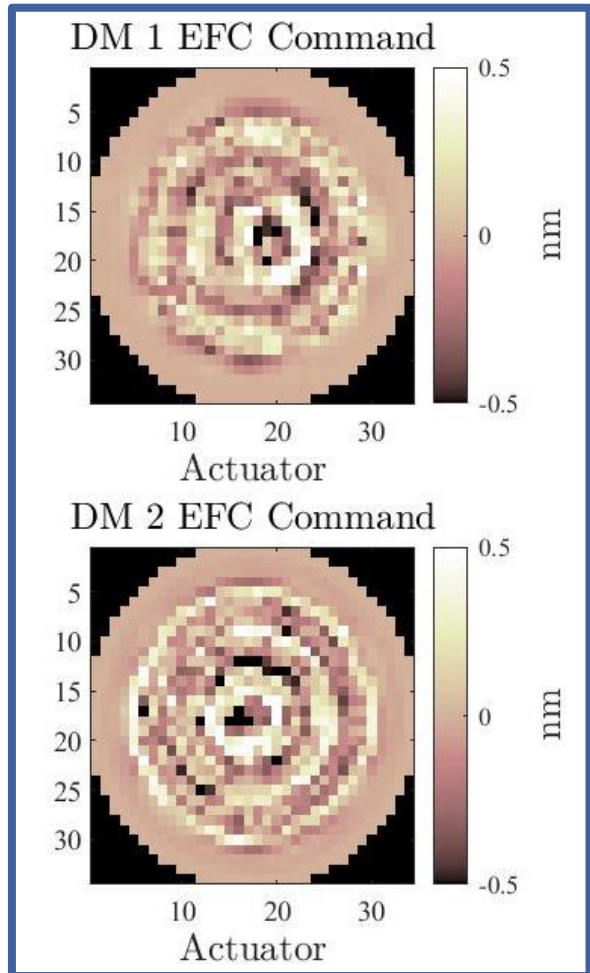
States: Electric field at each pixel in the dark hole on the science camera

Control: 2 x 952 Deformable Mirror actuators

Measurement: Intensity at each science camera pixel

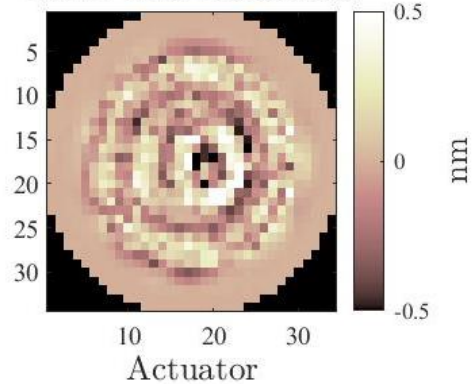
STEP 2: APPLY CONTROL:

$$u_{tot}^{k+1} = u_0 + \Delta u_{opt}^{k+1} + \delta u_{dith}^{k+1} + \delta u_{drift}^{k+1}$$

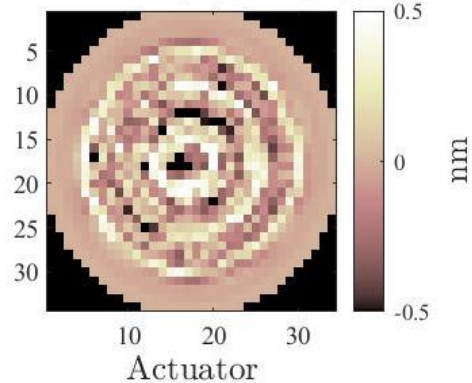


STEP 2: ELECTRIC FIELD CONJUGATION

DM 1 EFC Command



DM 2 EFC Command



Electric Field Conjugation:

$$\Delta u_{\text{opt}}^{k+1} = -(\mathbf{G}\mathbf{G}^T - \alpha\mathbf{I})^{-1} \mathbf{G}^T \hat{E}^k$$

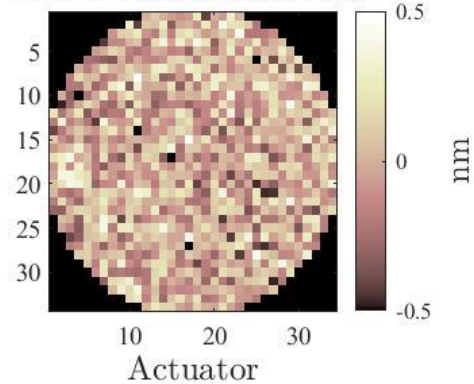
Jacobian

Regularization
Parameter

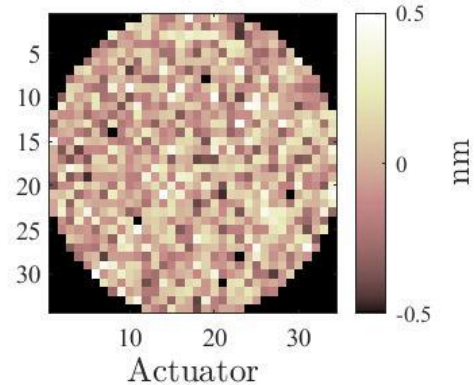
Estimate

STEP 2: DITHER

DM 1 Dither Command



DM 2 Drift Command



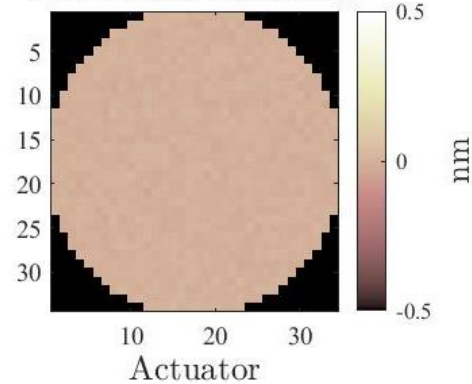
Dither Command:

- Acts as a 'probe'
- Increases phase diversity to improve estimate
- Random displacement applied to each actuator with standard deviation σ_{dith}

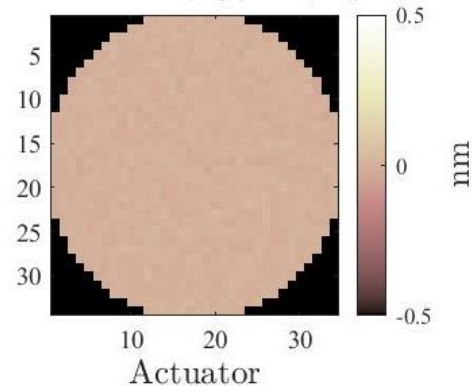
$$\delta \mathbf{u}_{dith}^{k+1} \sim \mathcal{N}(0, \sigma_{dith}^2 \mathbf{I})$$

STEP 2: DRIFT

DM 1 Drift Command



DM 2 Drift Command



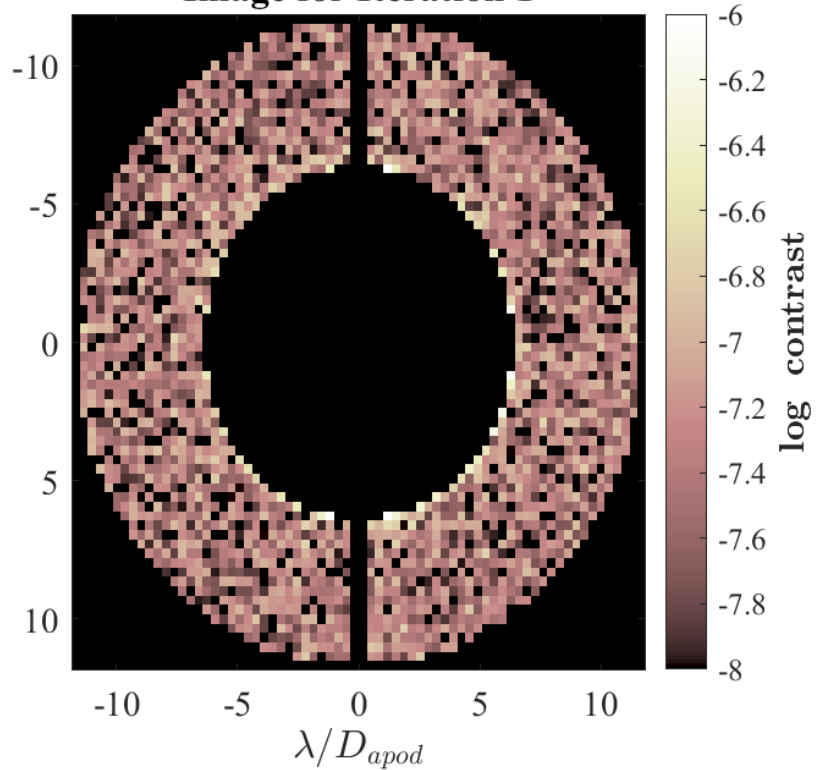
Drift Command:

- Manually inputs a drift/instability into the system
- Simple case: each actuator does a random walk from a normal distribution with standard deviation σ_{drift}
- Future drifts could be Zernike modes, lab temperature, etc.

$$\delta \mathbf{u}_{drift}^{k+1} = \delta \mathbf{u}_{drift}^k + \mathcal{N}(0, \sigma_{drift}^2 \mathbf{I})$$

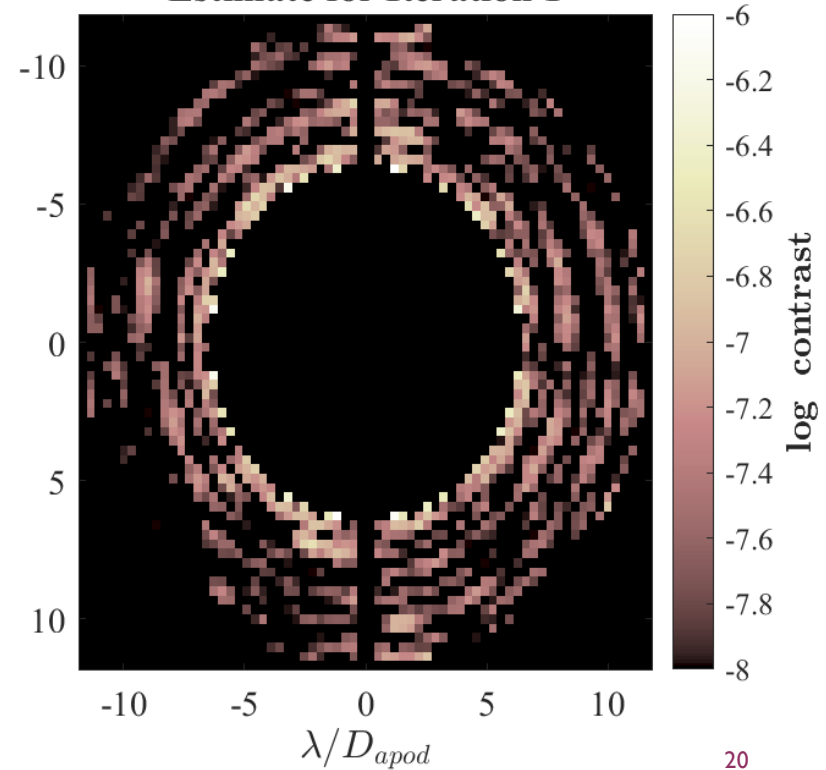
STEP I: ESTIMATE

Image for Iteration 1

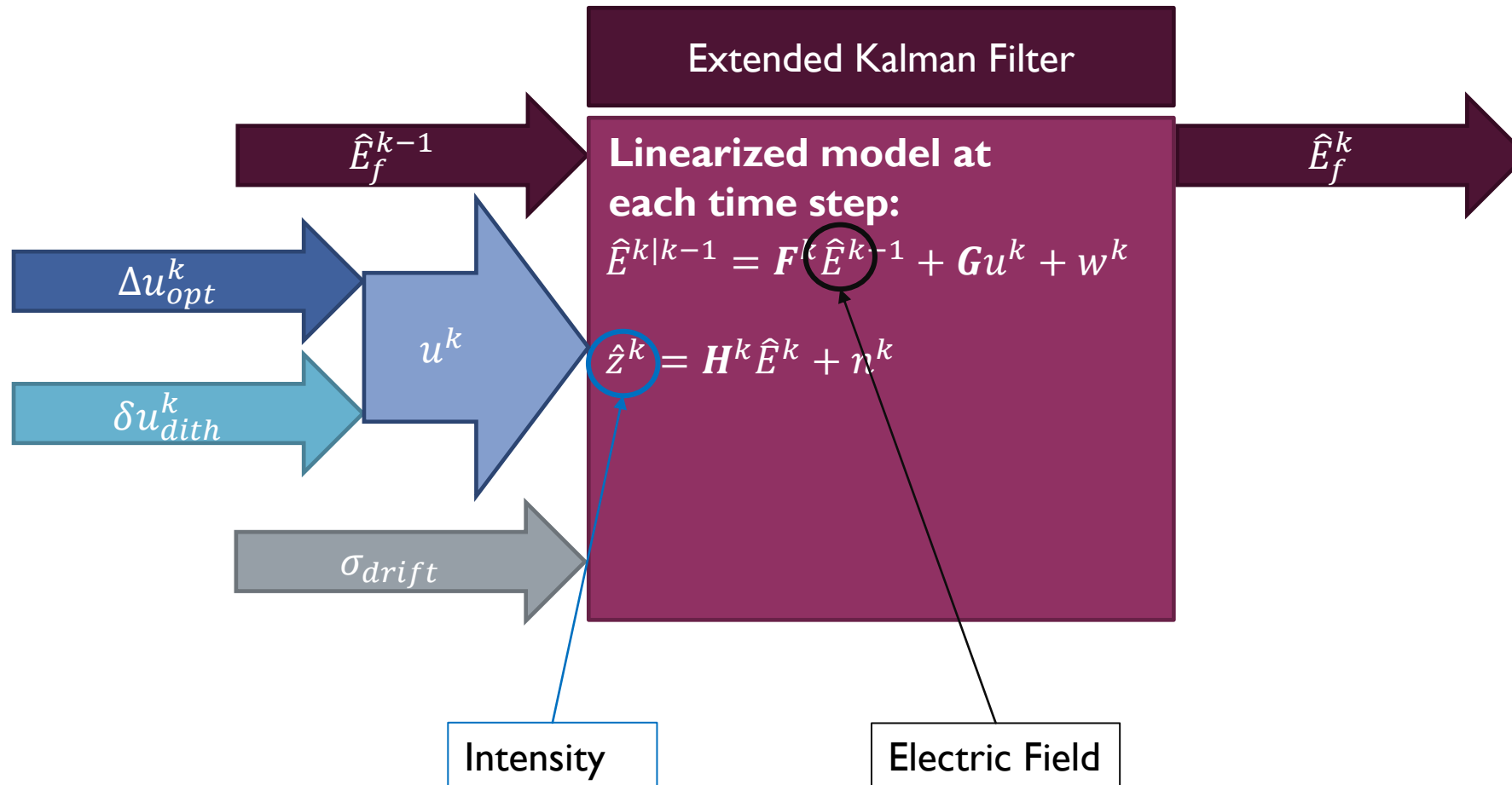


???

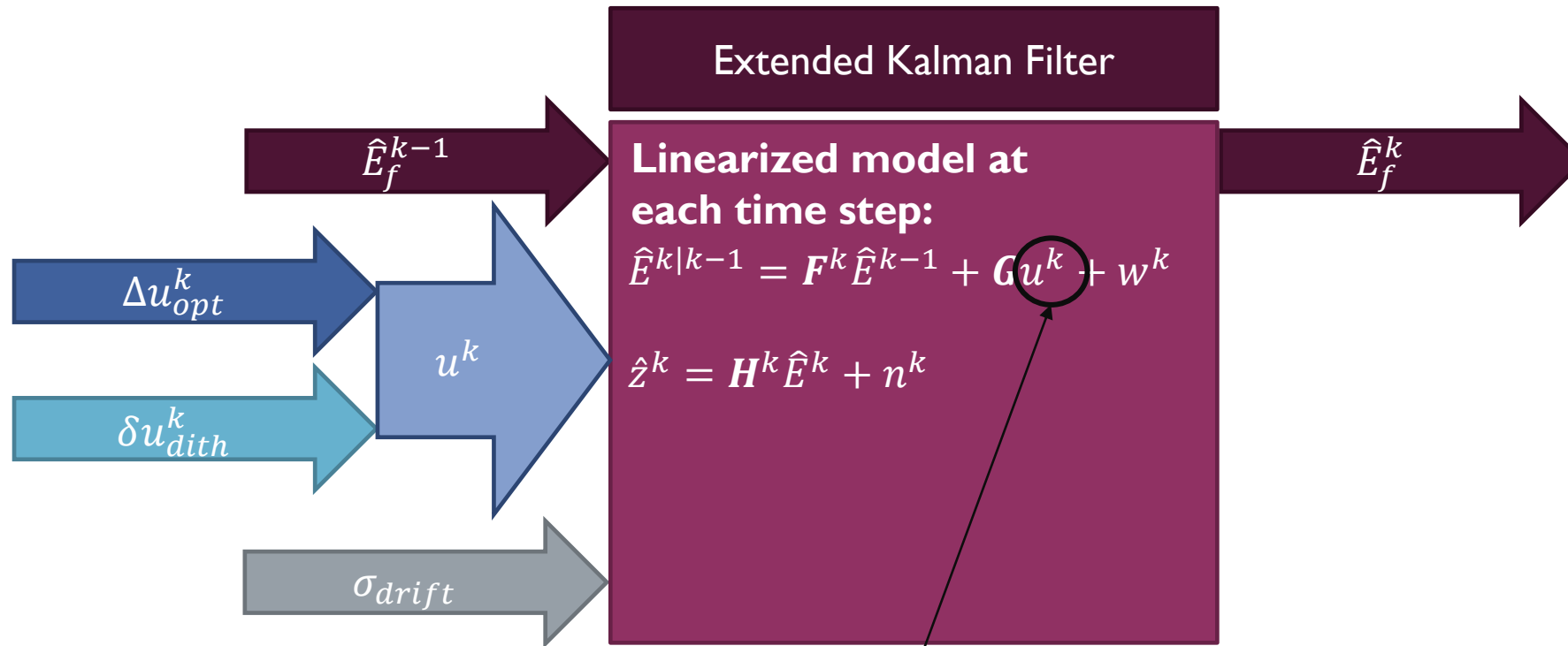
Estimate for Iteration 1



STEP I: ESTIMATE

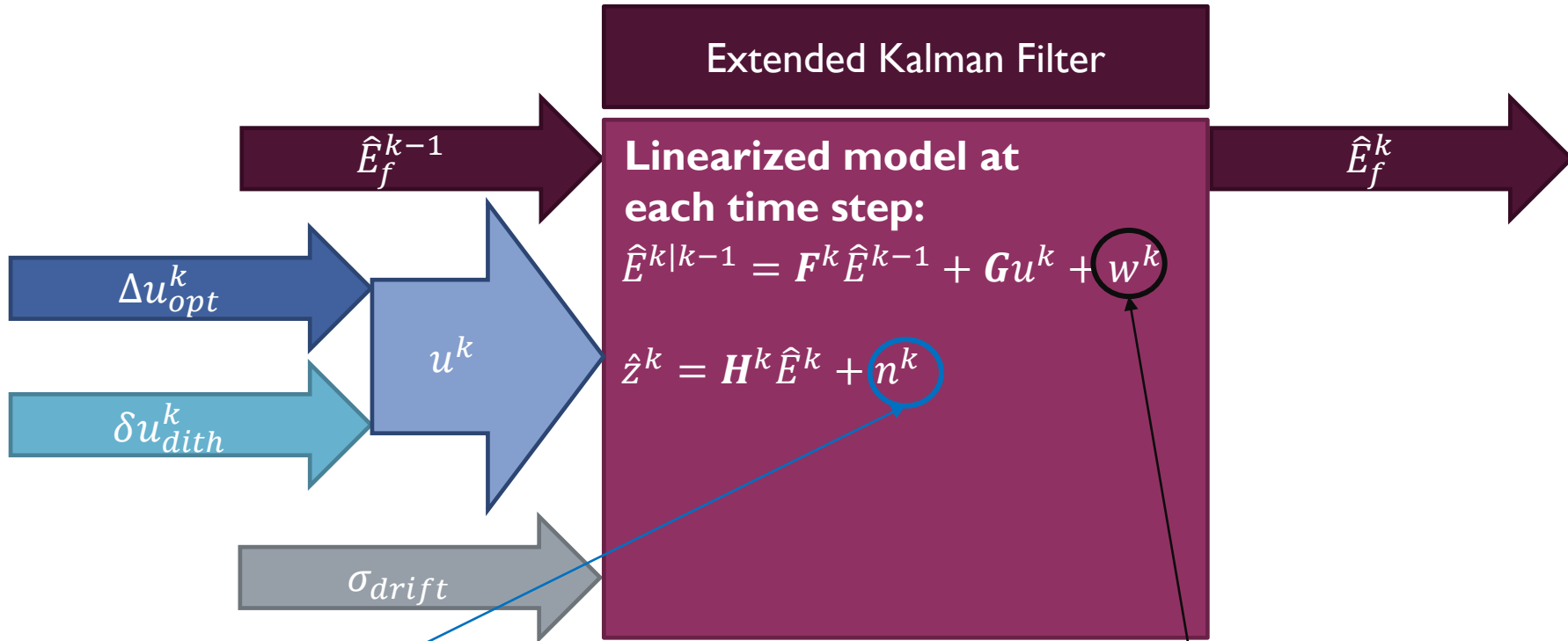


STEP I: ESTIMATE



- $u^k = \Delta u_{opt}^k + \delta u_{dith}^k$
- Need δu_{dith}^k to avoid estimate converging to incorrect value (Riggs, 2016)

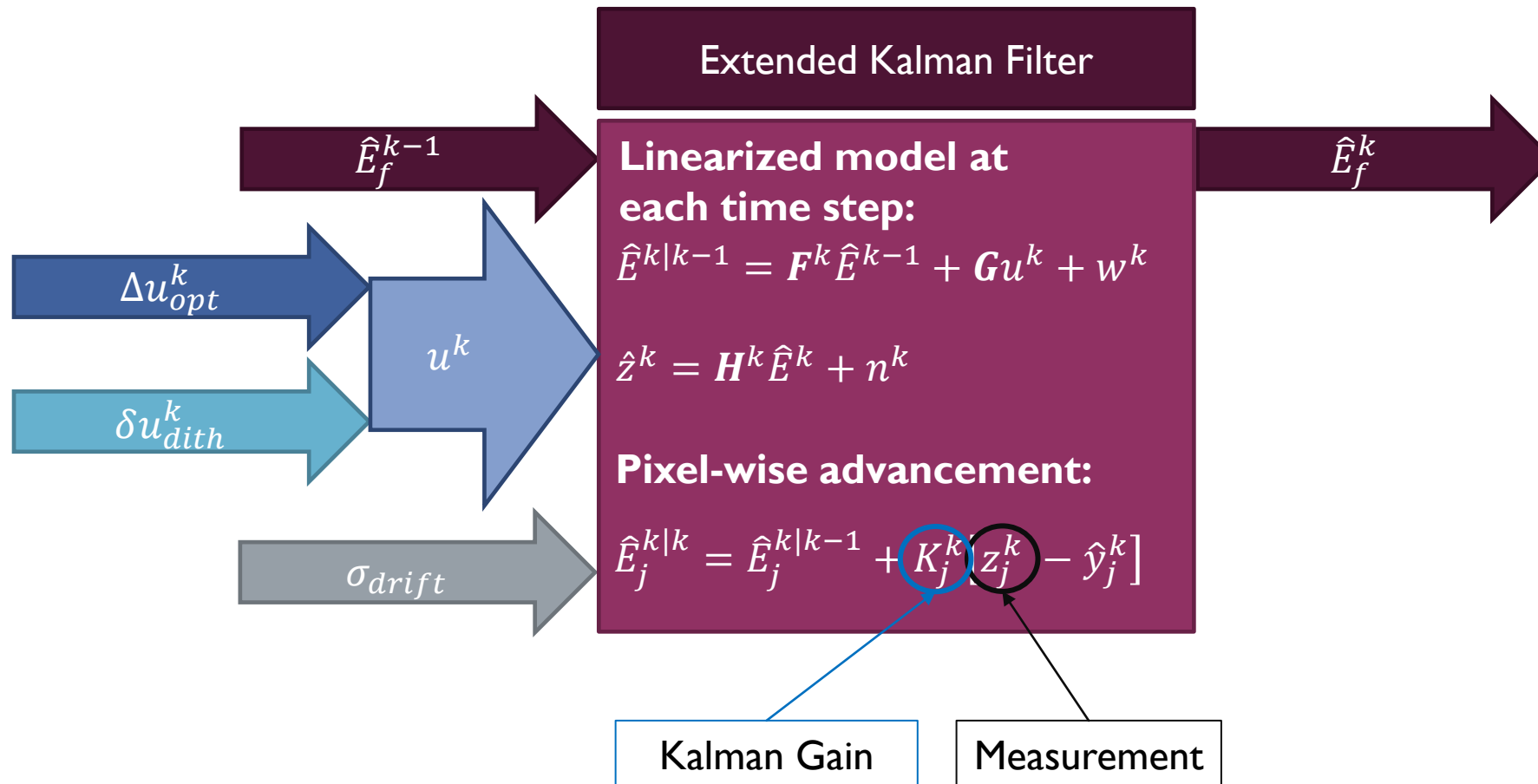
STEP I: ESTIMATE



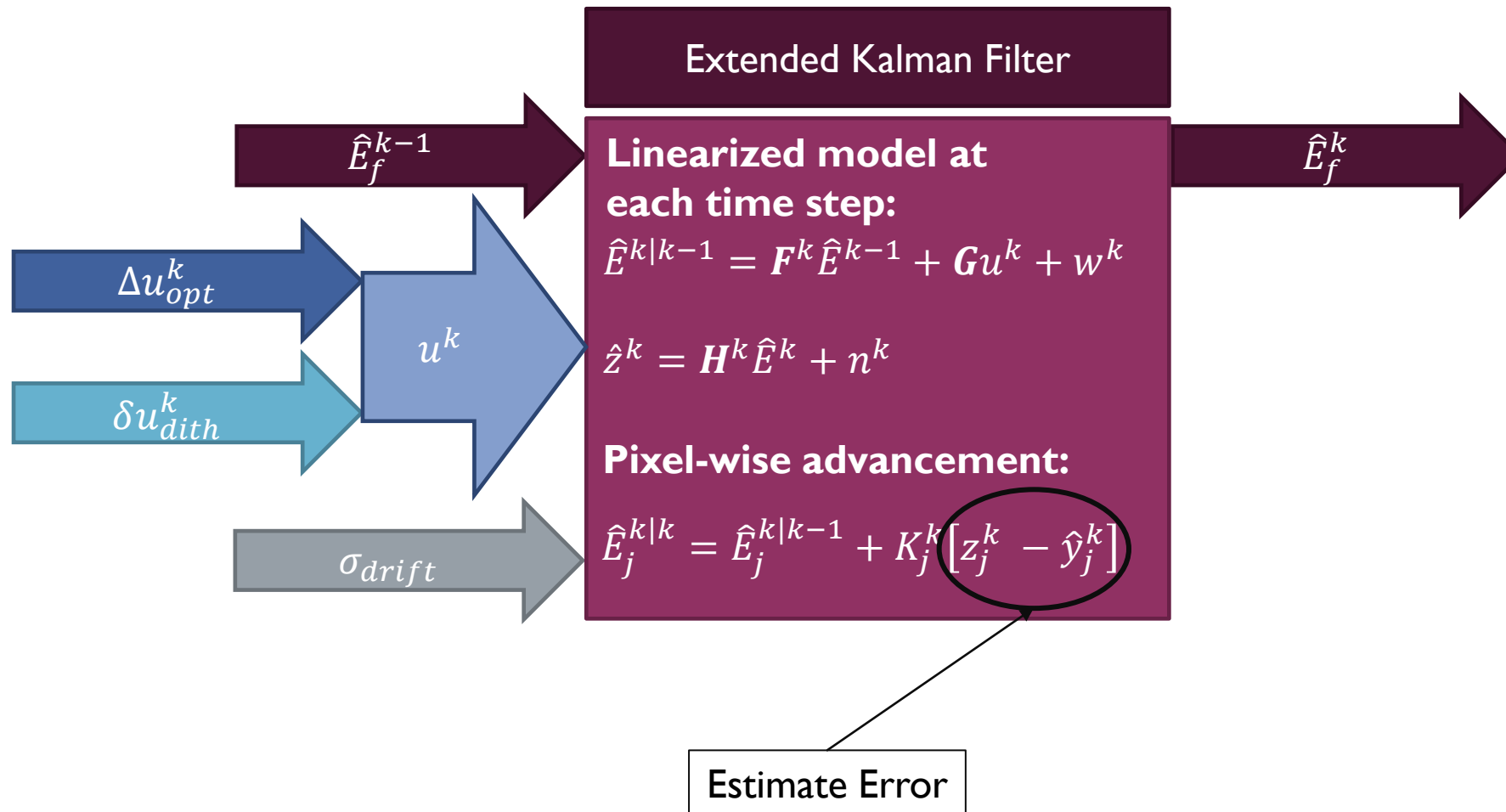
Measurement noise from camera and scattered star light

Drift (σ_{drift}) from the deformable mirrors

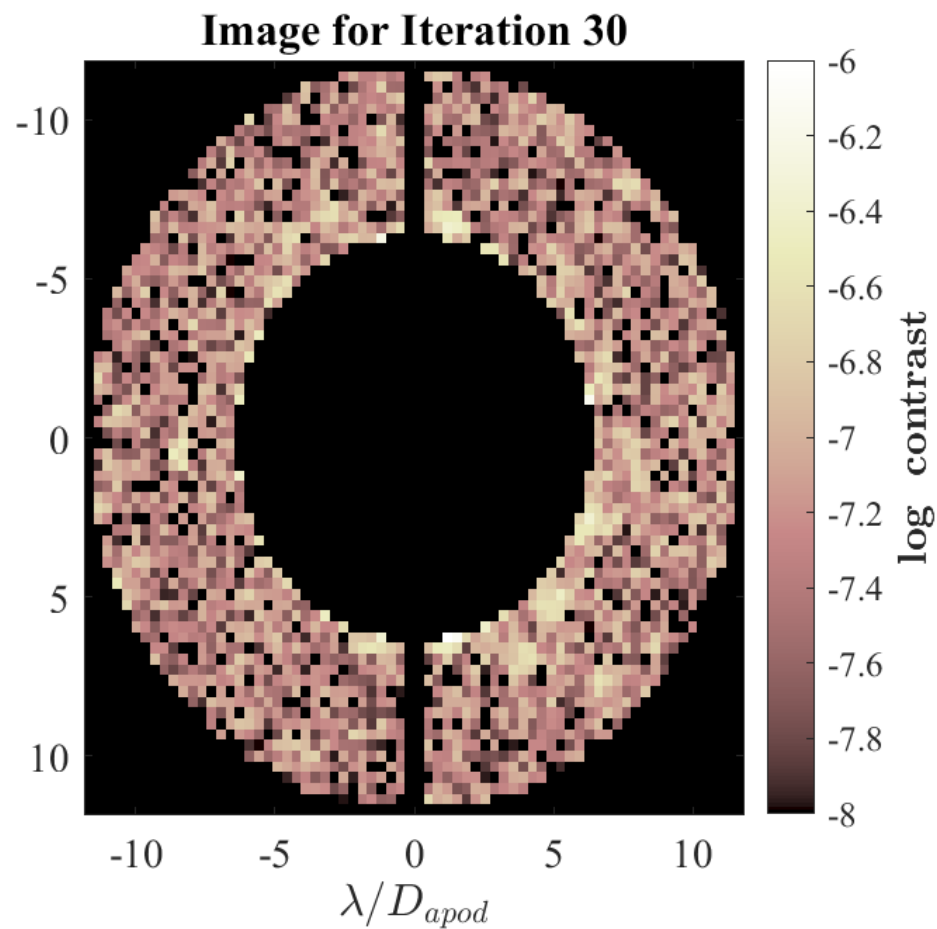
STEP I: ESTIMATE



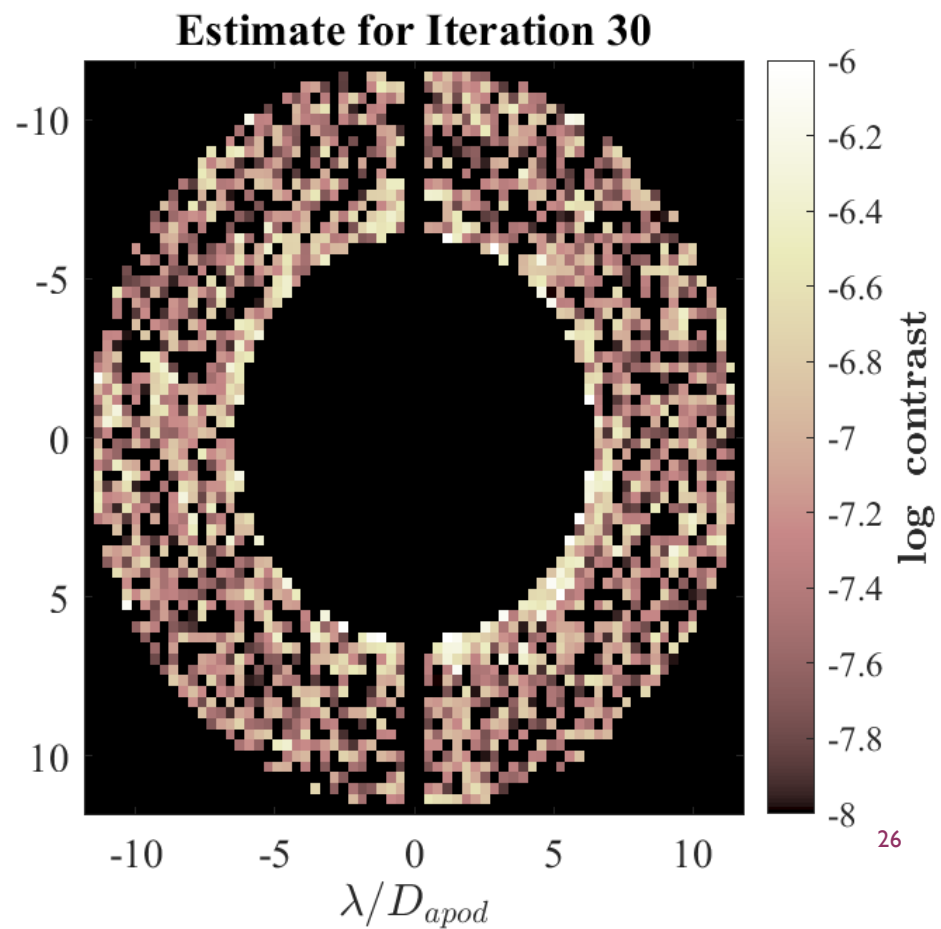
STEP I: ESTIMATE



STEP 3: REPEAT AS DESIRED



Estimator tends to converge within ~30 iterations using an appropriate dither value





HICAT RESULTS

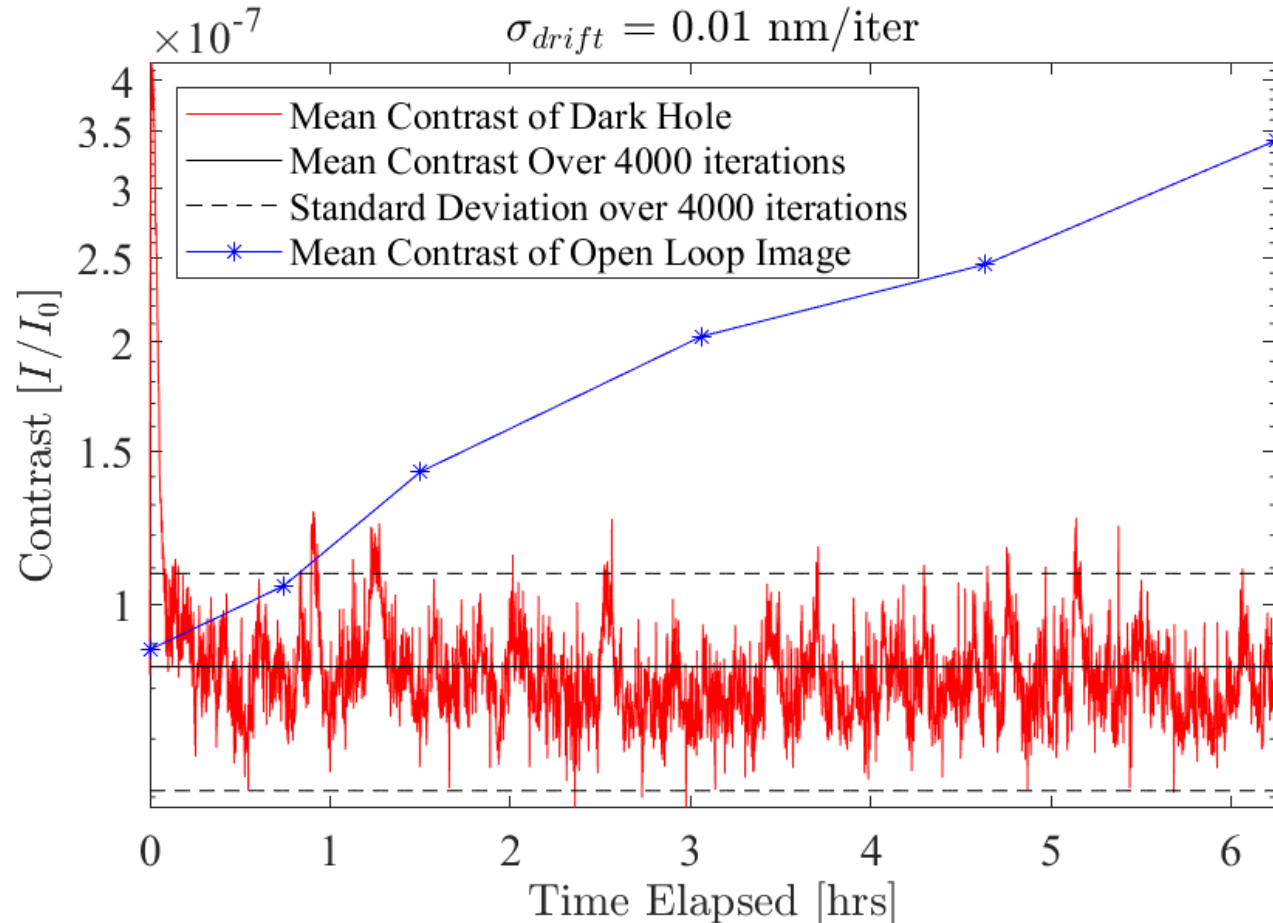
27

LONG MAINTENANCE RUN PERFORMANCE

Mean Contrast vs Time

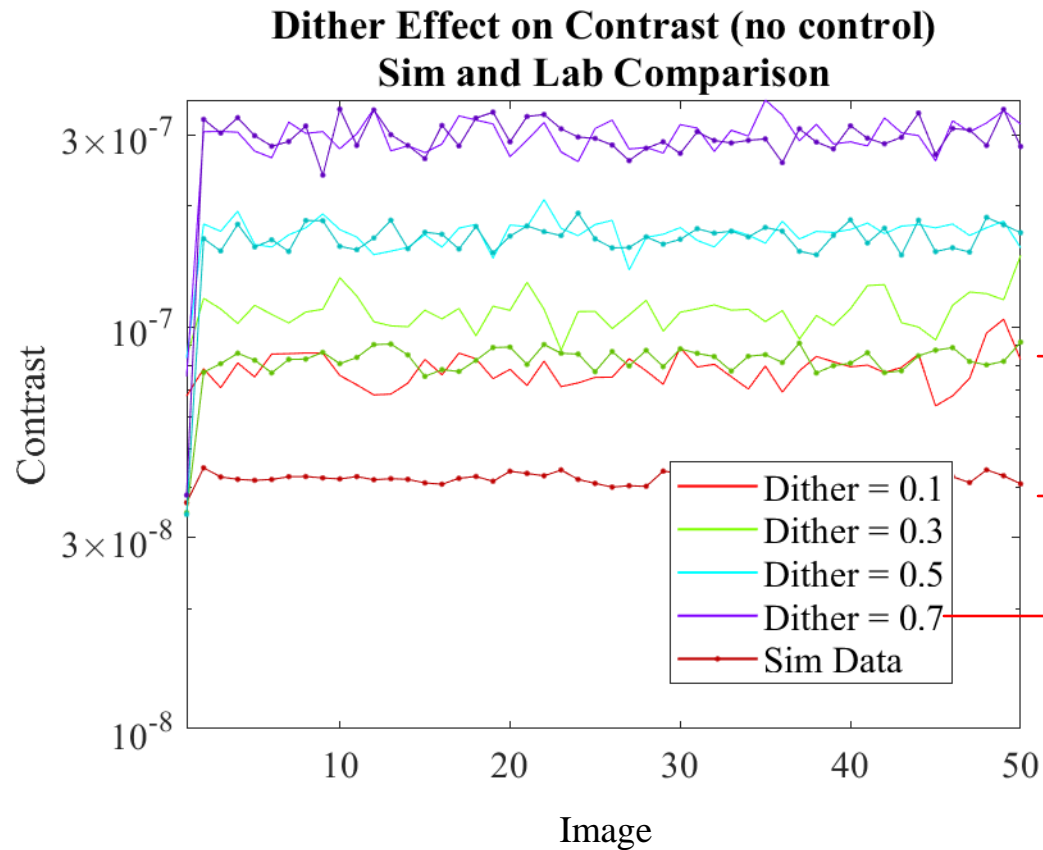
$$\sigma_{dither} = 0.2 \text{ nm}$$

$$\sigma_{drift} = 0.01 \text{ nm/iter}$$



- Open loop mean contrast degrades by a factor of 4 over the six hour experiment
- Closed loop mean contrast is maintained at 8.5×10^{-8} within a standard deviation of 2.4×10^{-8}

RAW EFFECT OF DITHERING DMS WITHOUT CONTROL



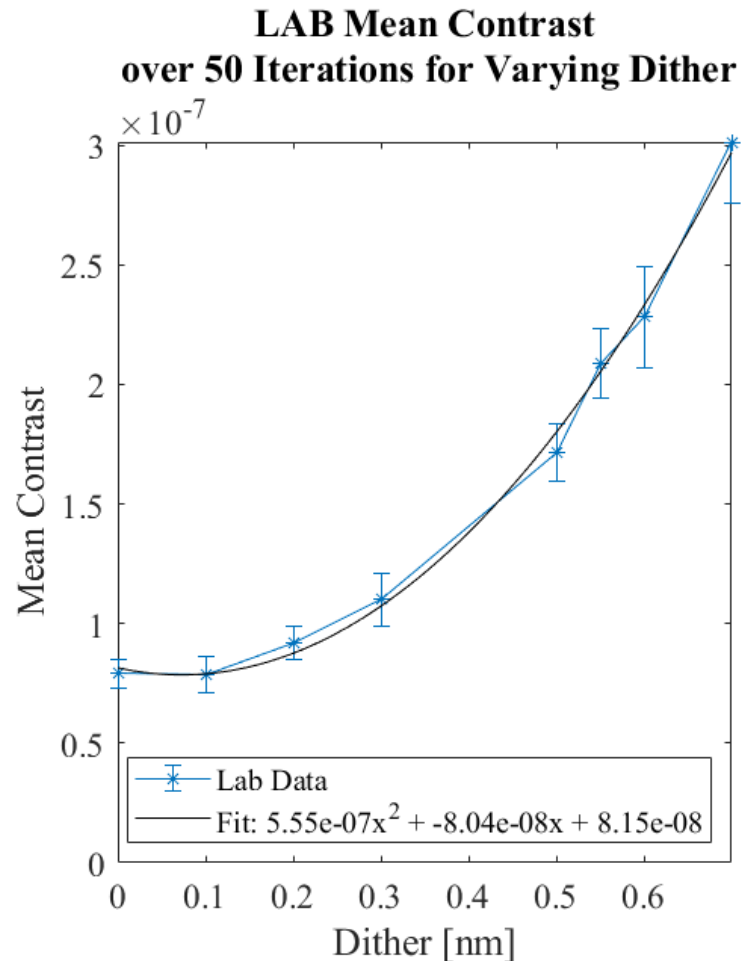
Without any control, dithering the DMs degrades the contrast*

$$u = u_0 + \mathcal{N}(0, \sigma_{dith}^2 \mathbf{I})$$

*This depends on the initial contrast, if the dither is below a certain threshold the contrast does not change

σ_{dith} [nm]

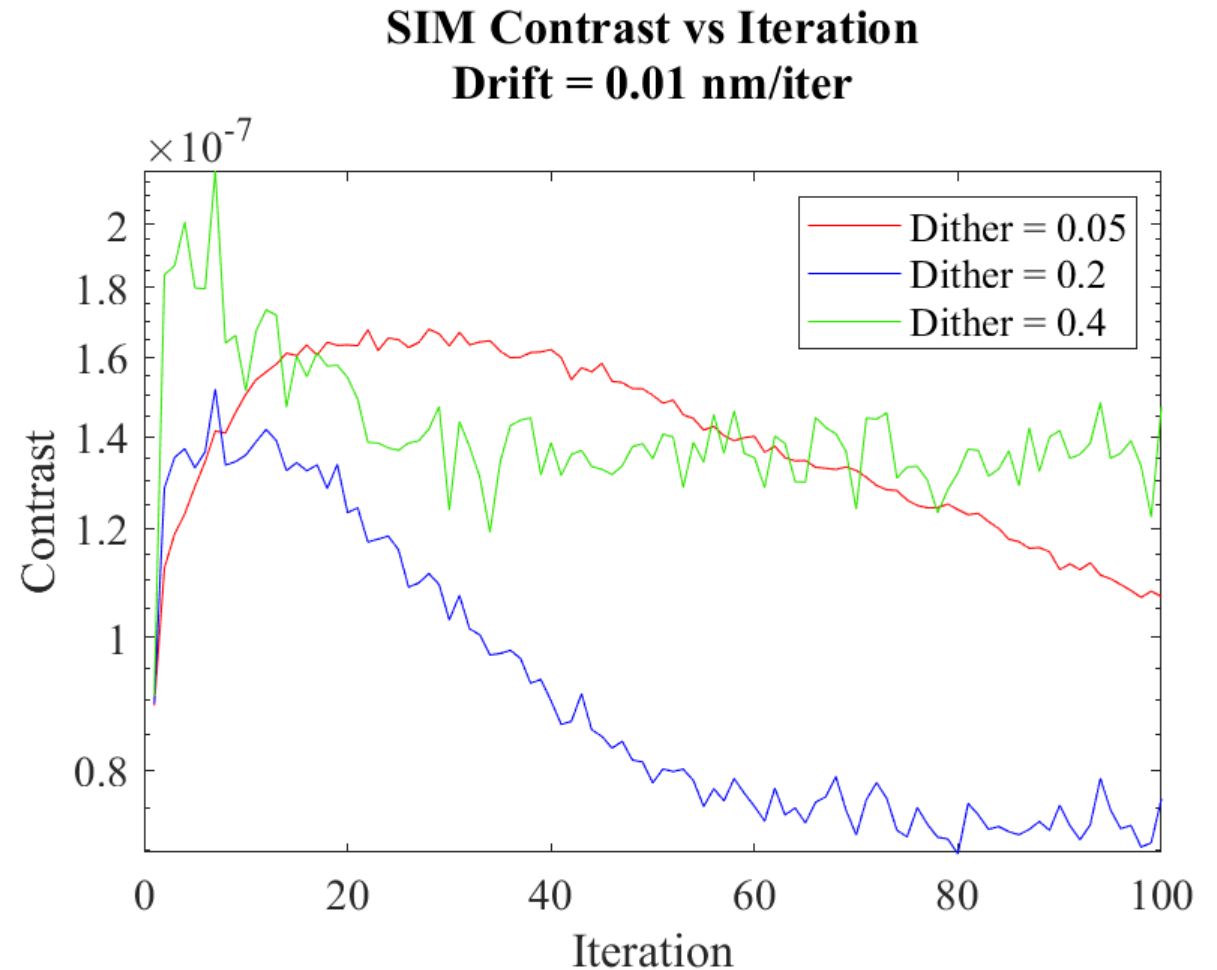
RAW EFFECT OF DITHERING DMS



- We can then fit the data and predict the ‘limiting’ contrast based on the dither
- This would suggest that we want to choose a dither of zero BUT this is not the whole story, we have an estimator and control loop too!

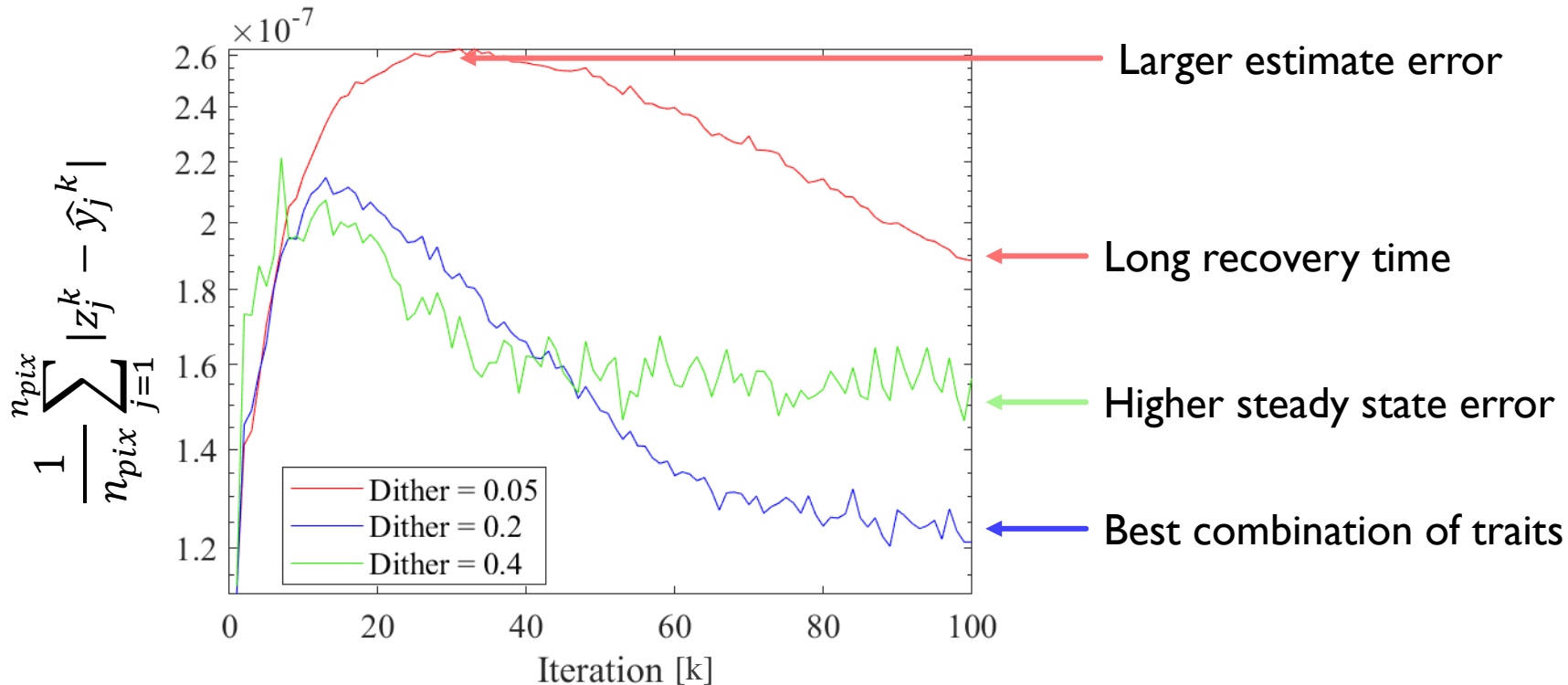
EFFECT OF DITHER ON MAINTENANCE PERFORMANCE

- Small dither ($5 \times \sigma_{drift}$):
 - Shallow slope
 - Takes longer to shoot off and recover
 - Reaches original contrast at ~ 200 iterations
- Large dither ($40 \times \sigma_{drift}$):
 - Steep slope pre and post contrast
 - Asymptotes to higher final contrast
- Medium dither ($20 \times \sigma_{drift}$):
 - Smaller offshoot than large dither
 - Steeper slope than small dither
 - Asymptotic contrast is on par with original state



DITHER AND ESTIMATE CONVERGENCE

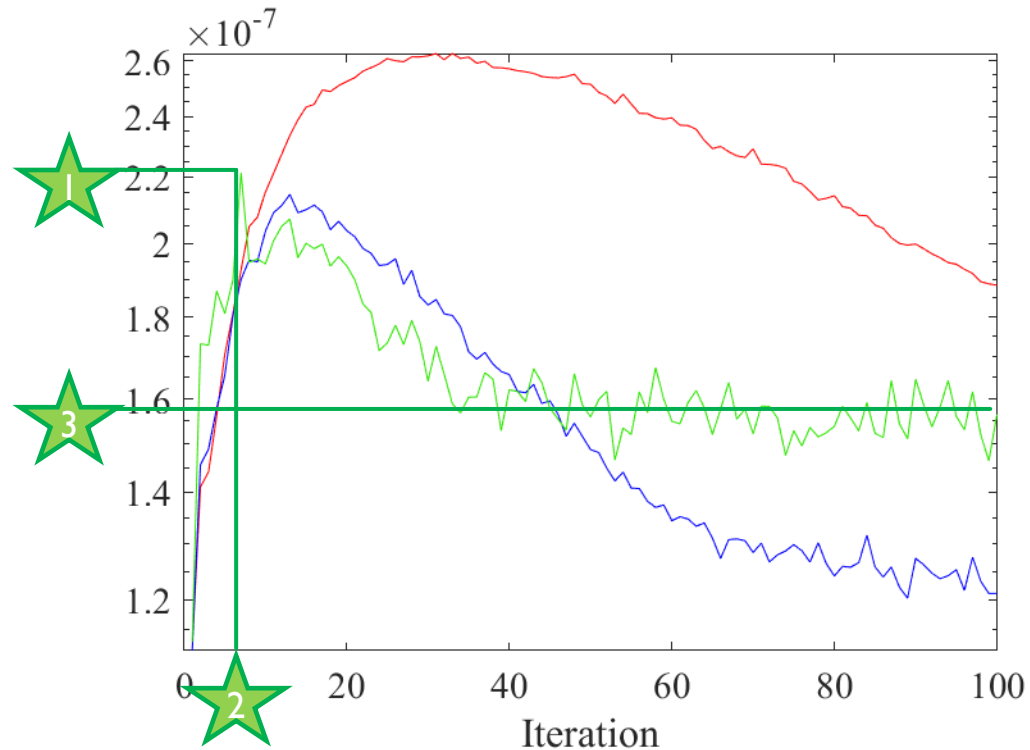
SIM Absolute Intensity Estimation Error vs Iteration
Drift = 0.01 nm/iter



Note: Estimate error has same trend as contrast. The better the estimate, the more effective the control and the better the contrast.

DITHER AND ESTIMATE CONVERGENCE

SIM Absolute Intensity Estimation Error vs Iteration
Drift = 0.01 nm/iter



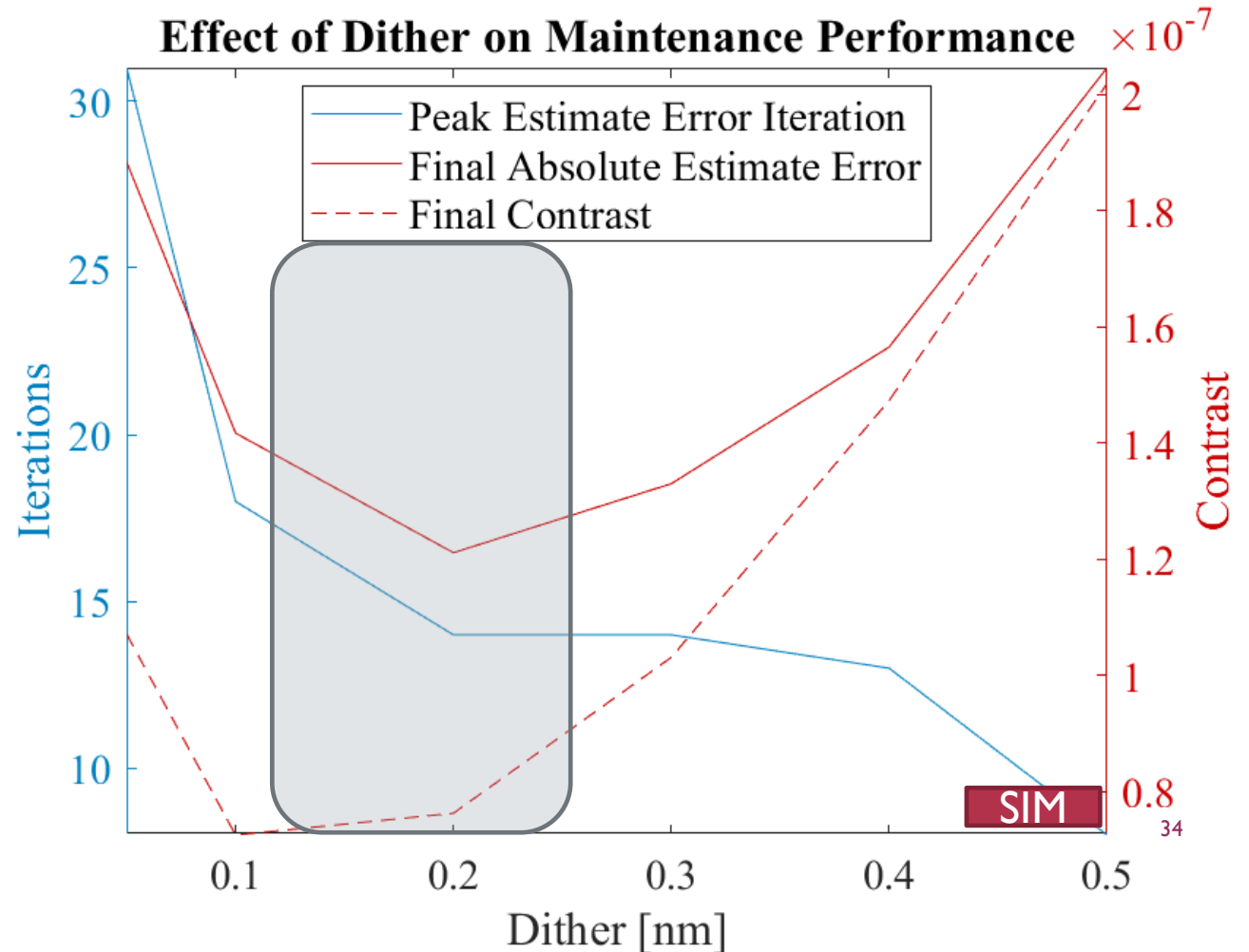
- Looking at three main parameters:

1. Peak estimation error [contrast]
2. Number of iterations until peak [iterations]
3. Asymptotic estimation error [contrast]

CHOOSING THE 'BEST' DITHER

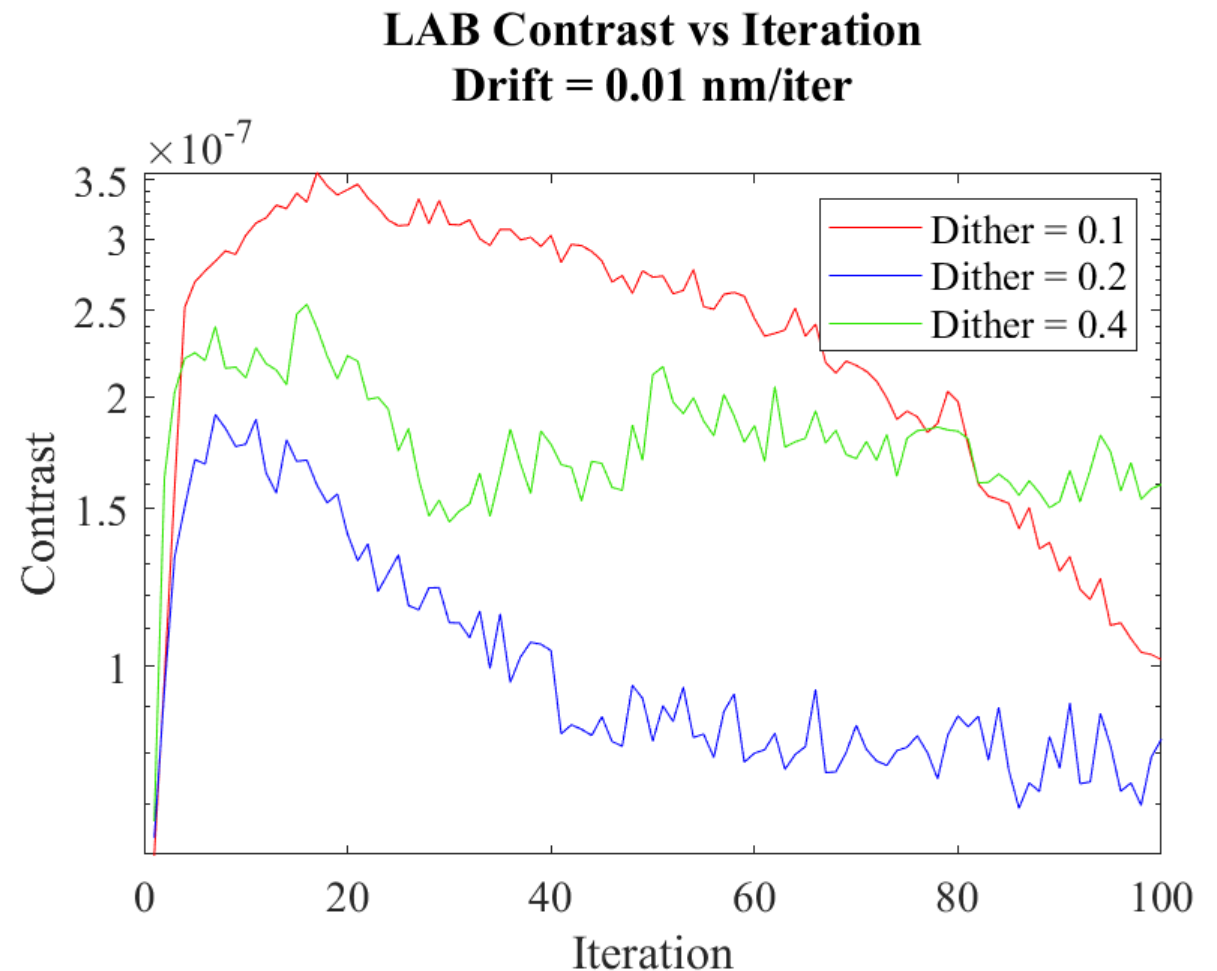
- Ultimate Goal:
 - Estimator converges fast
 - Estimate error is small
 - Final Contrast is small
- Caveats:
 - This is for a single DM drift
 - $\sigma_{drift} = 0.01 \text{ nm/iter}$
 - Repeating this process for various drifts shows that for best performance:

$$\sigma_{dither} \approx 20 \times \sigma_{drift}$$



LAB VERIFICATION!

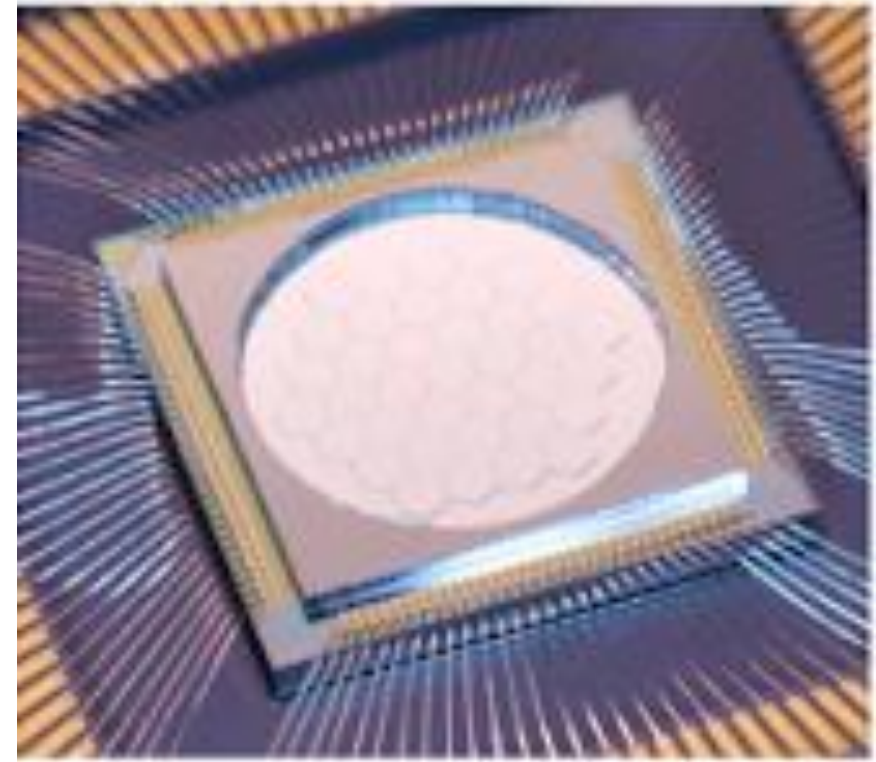
- The same trend is observed in the lab!
- Large dither limits steady state contrast
- Small dither takes a long time to recover
- $\sigma_{dither} \approx 20 \times \sigma_{drift}$ performs the best



SUMMARY AND FUTURE WORK

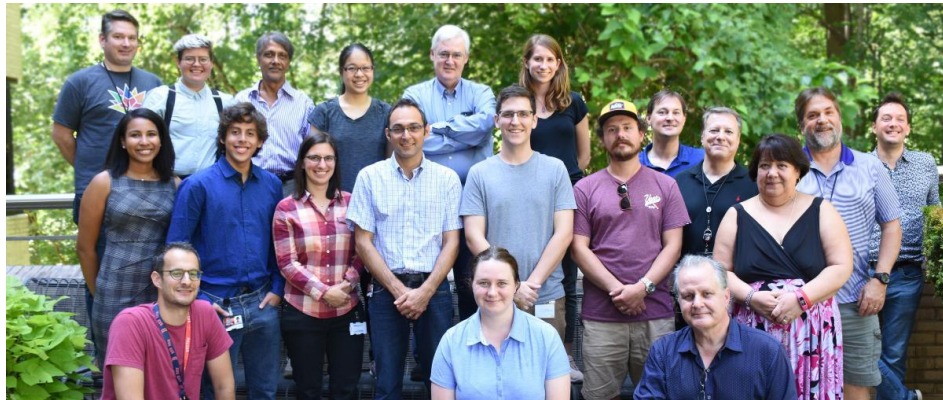
SUMMARY AND FUTURE WORK

- The EKF + EFC dark hole maintenance algorithm presented here can maintain contrast levels of 7×10^{-8} in the presence of a DM random walk drift for thousands of iterations / 6 hrs
- Next steps:
 - Use the recently installed an Iris AO Deformable primary mirror to introduce drifts
 - Drift using Zernike modes instead of random walk of each actuator
 - Use the temperature as the drift
 - Add broadband capabilities
 - Translate testbed results into mission implications



IRIS AO Segmented Mirror

ACKNOWLEDGEMENTS



QUESTIONS?

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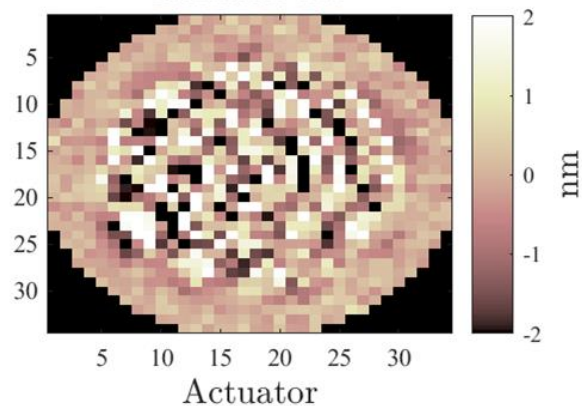
VALIDATION OF REAL TIME DRIFT CORRECTION

- Goal: Show that the open loop electric field is drifting and the estimator+controller is correcting for it in real time.
- Algorithm:
 1. Take close loop image
 - a. Apply closed loop DM command: $u^{CL}(k + 1) = u_0 + \Delta u_{opt}(k) + \delta u_{dith}(k) + \delta u_{drift}(k)$
 - b. Take image
 2. Take open loop image
 - a. Apply open loop DM command: $u^{OL}(k + 1) = u_0 + \delta u_{drift}(k)$
 - b. Take image
 3. Advance Estimator using closed loop data
 4. Obtain new optimal DM command using closed loop data
 5. Repeat

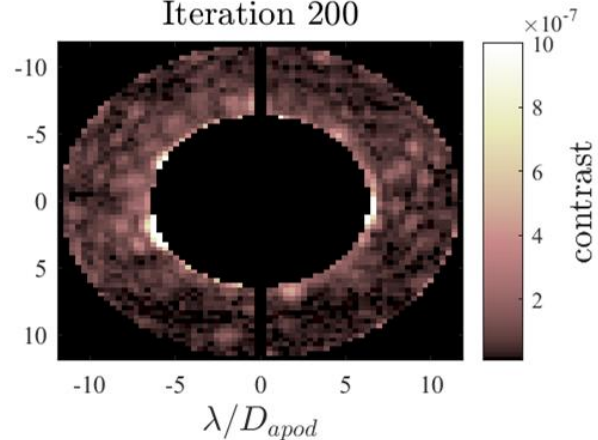
VALIDATION OF REAL TIME DRIFT CORRECTION

$$\Delta u_{opt}(k) + \delta u_{dith}(k) + \delta u_{drift}(k)$$

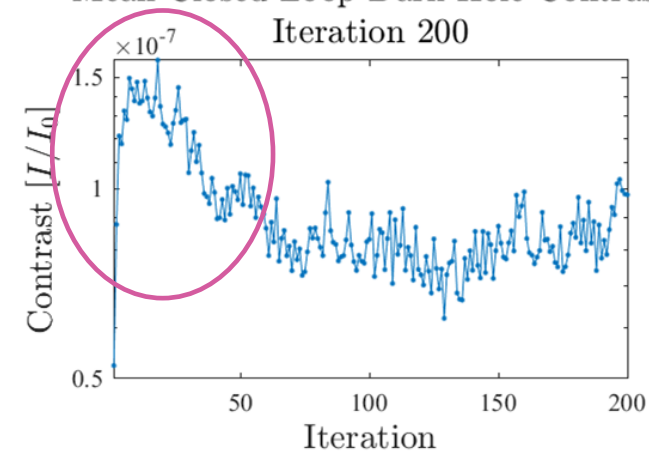
DM 1 Closed Loop Command
Iteration 200



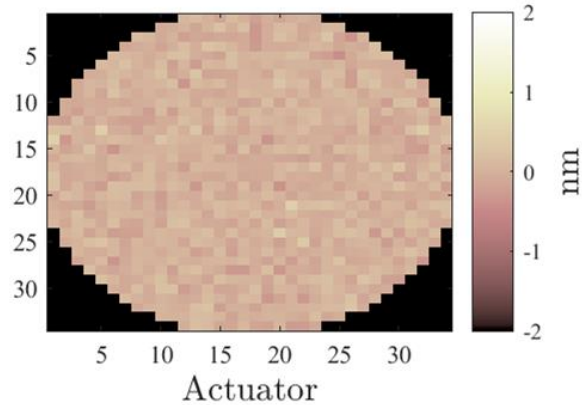
Closed Loop Image
Iteration 200



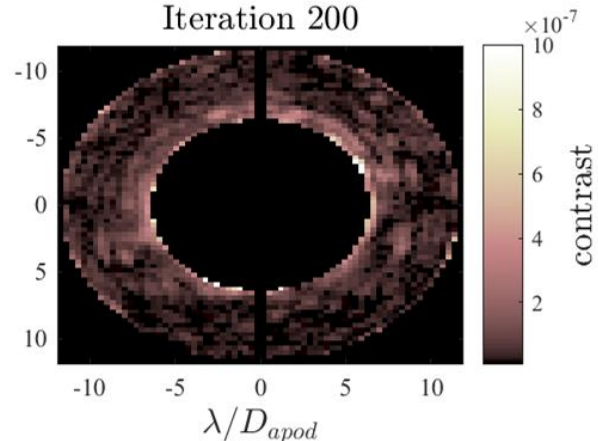
Mean Closed Loop Dark Hole Contrast
Iteration 200



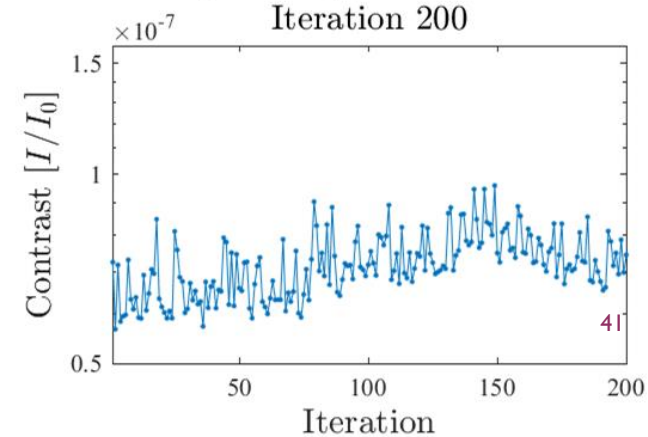
DM 1 Open Loop Command
Iteration 200



Open Loop Image
Iteration 200



Mean Open Loop Dark Hole Contrast
Iteration 200



$$\delta u_{drift}(k)$$