

# REVERBERATION MAPPING WITH THE AUSTRALIAN DARK ENERGY SURVEY (DES+OZDES)

Tamara Davis  
University of Queensland

On behalf of the OzDES RM team, in particular: **Janie Hoormann, Paul Martini, Umang Malik (talk Monday), Andrew Penton, Zhefu Yu (talk today),**  
Rob Sharp, Brad Tucker, Chris Lidman, Natalia Sommer, Dale Mudd

Key papers:

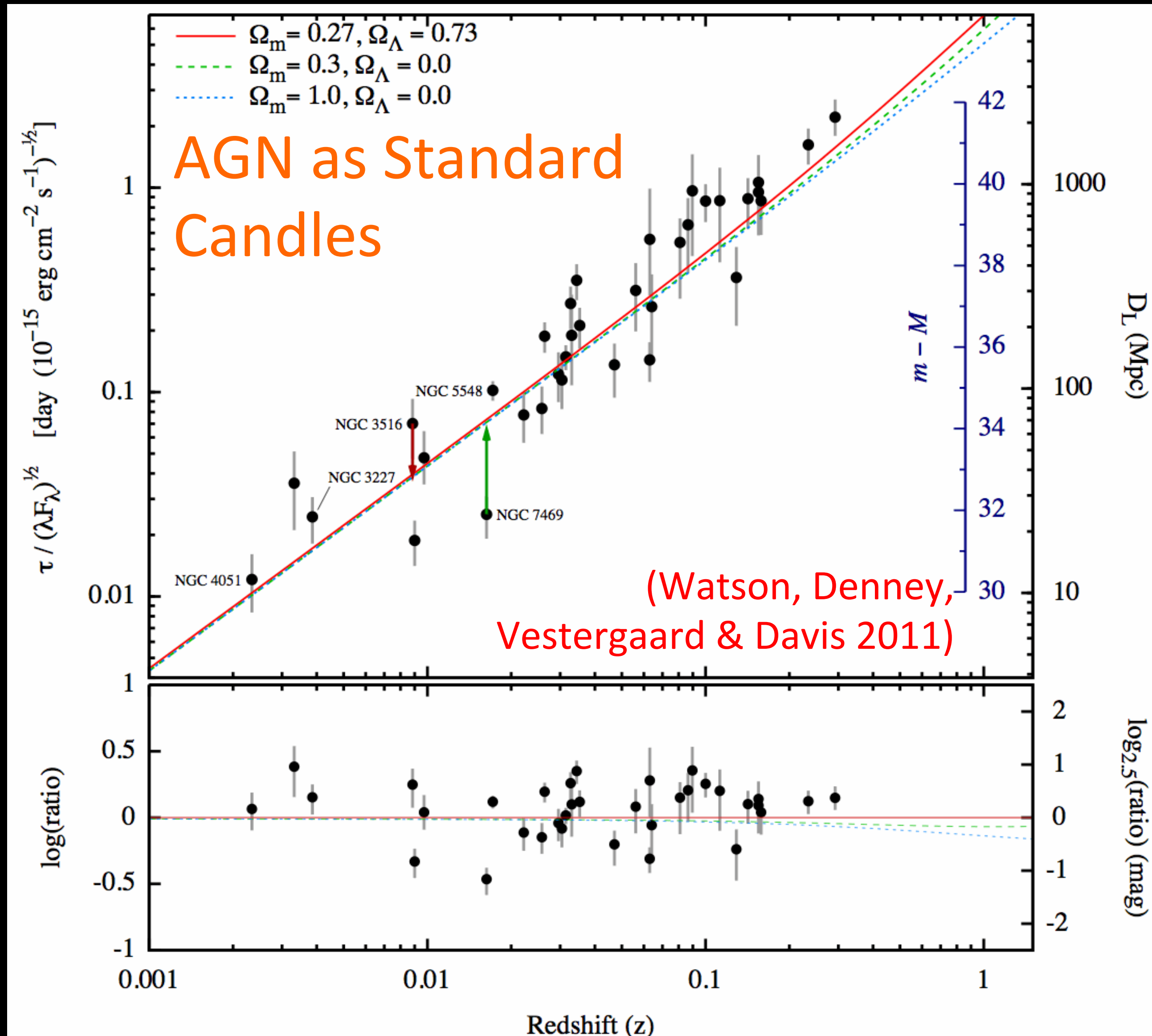
**Spec RM: Hoormann et al. 1902.04206 "C IV black hole mass measurements with the Australian Dark Energy Survey (OzDES)"**

Cont RM: Mudd et al. 1711.11588 "Quasar Accretion Disk Sizes from Continuum Reverberation Mapping from DES" + Yu et al. submitted  
Mudd et al. 1606.02717 "Discovery of a  $z = 0.65$  post-starburst BAL quasar in the DES supernova fields"

Data: Childress et al. 1708.04526 "OzDES: 3-yr results and first data release"

Yuan et al. 1504.03039 "OzDES: first-year operation and results"

# HOW I GOT INTERESTED IN AGN...







# THE DARK ENERGY SURVEY

Weak Lensing

Galaxy clusters

Baryon Acoustic Oscillations

Supernovae

~500 researchers

5 years (from 2013)

525 Nights

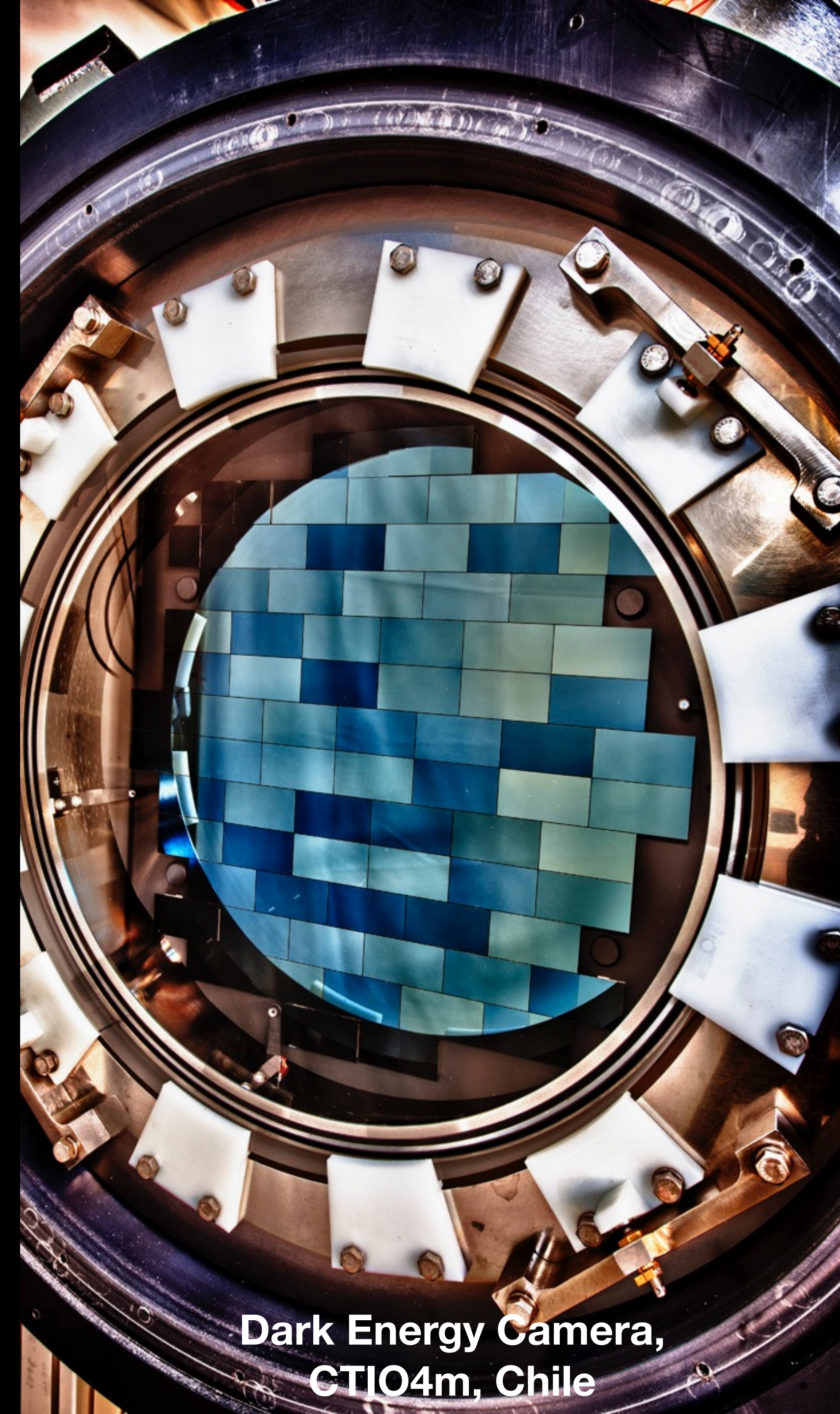
5000 square degrees

5 filters

Time-lapse over 30 square degrees

~300 million  
galaxies

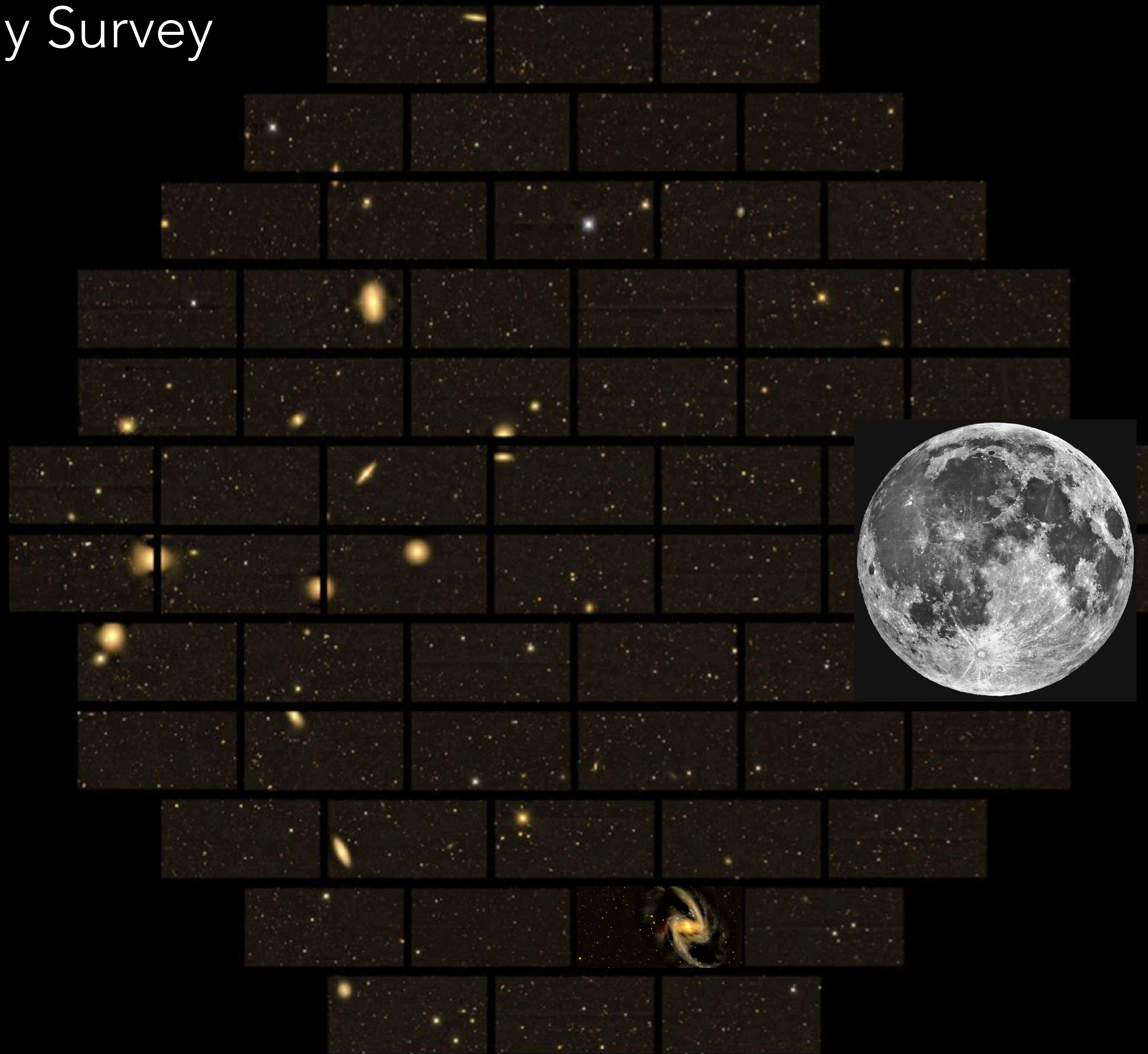
~3000  
supernovae



Dark Energy Camera,  
CTIO4m, Chile



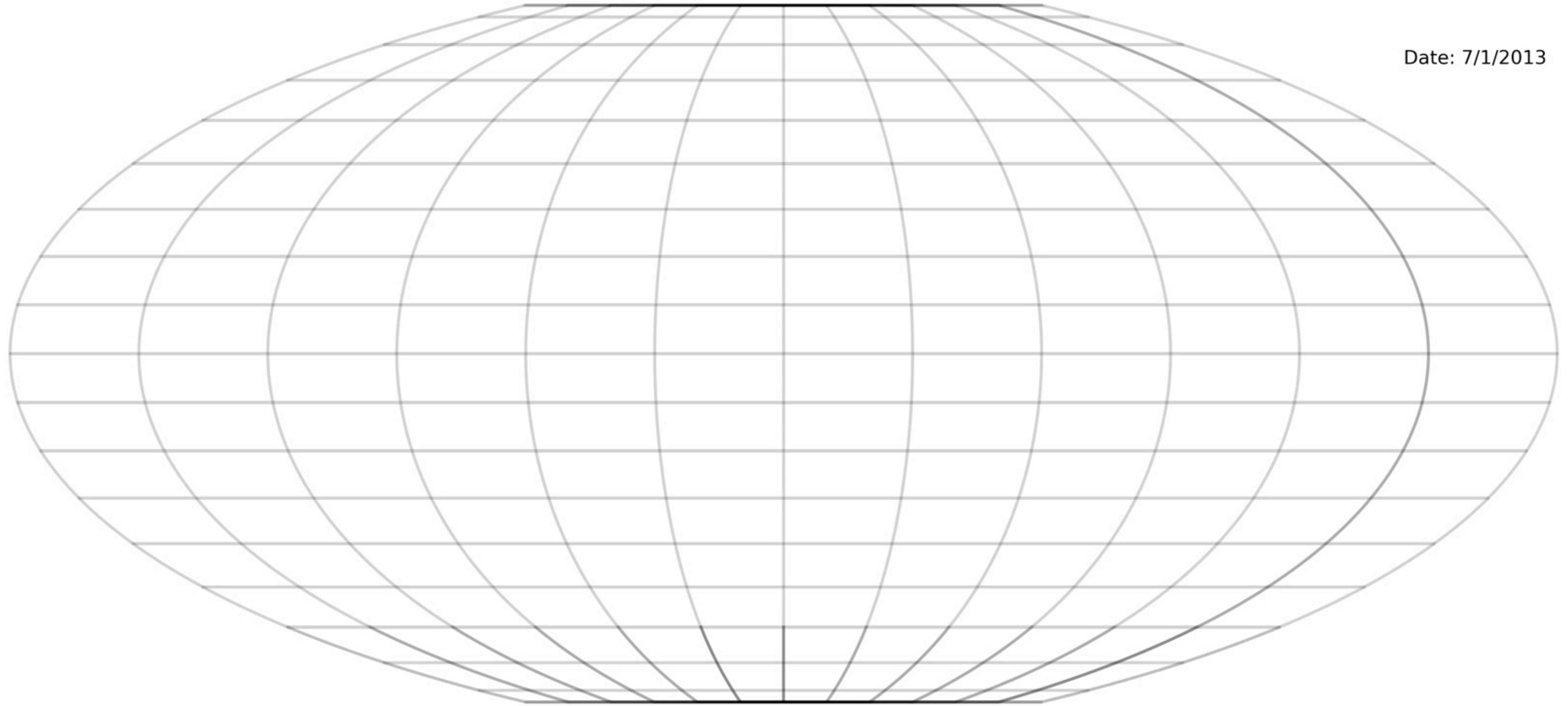
# The Dark Energy Survey





z Band

Date: 7/1/2013

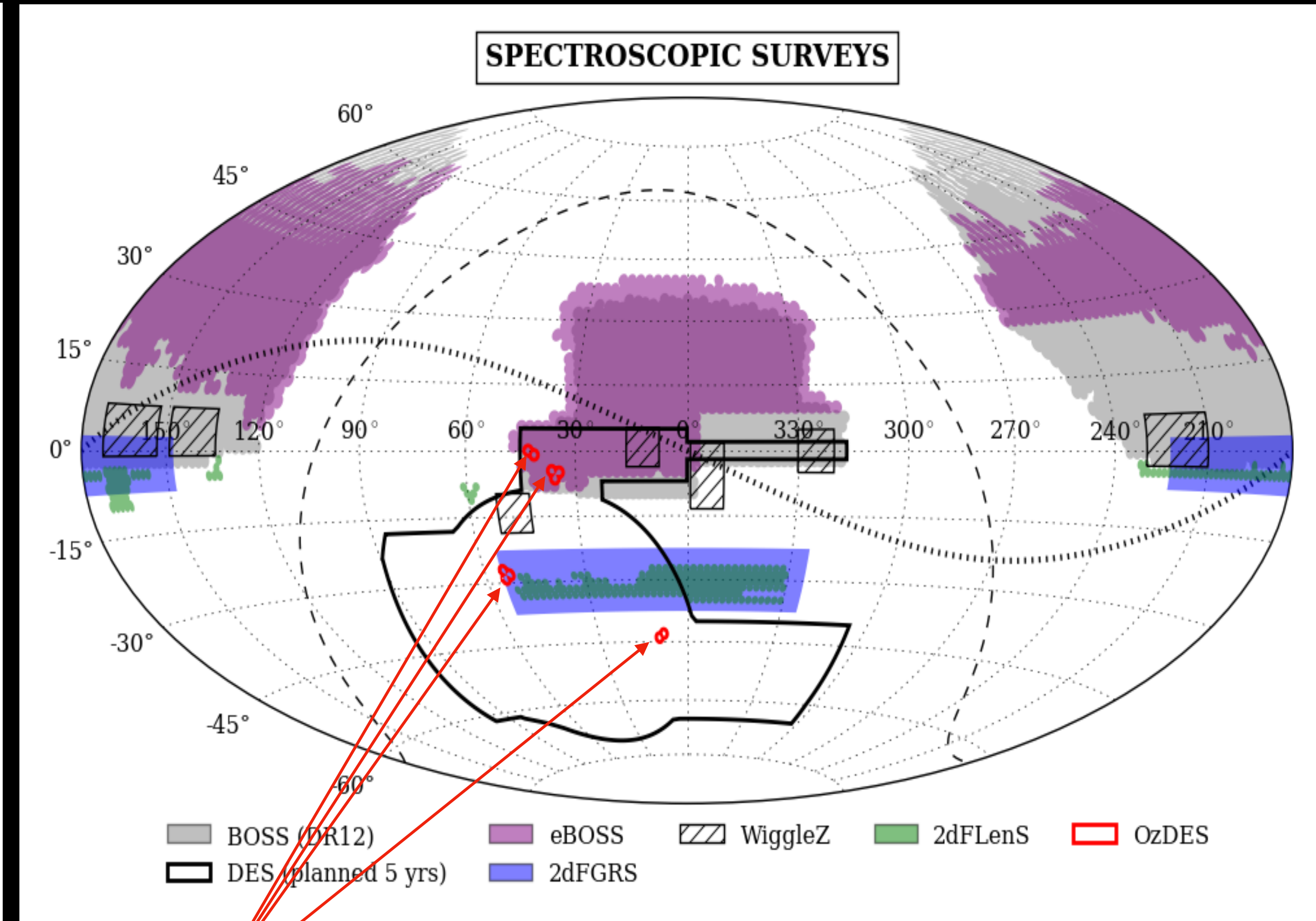
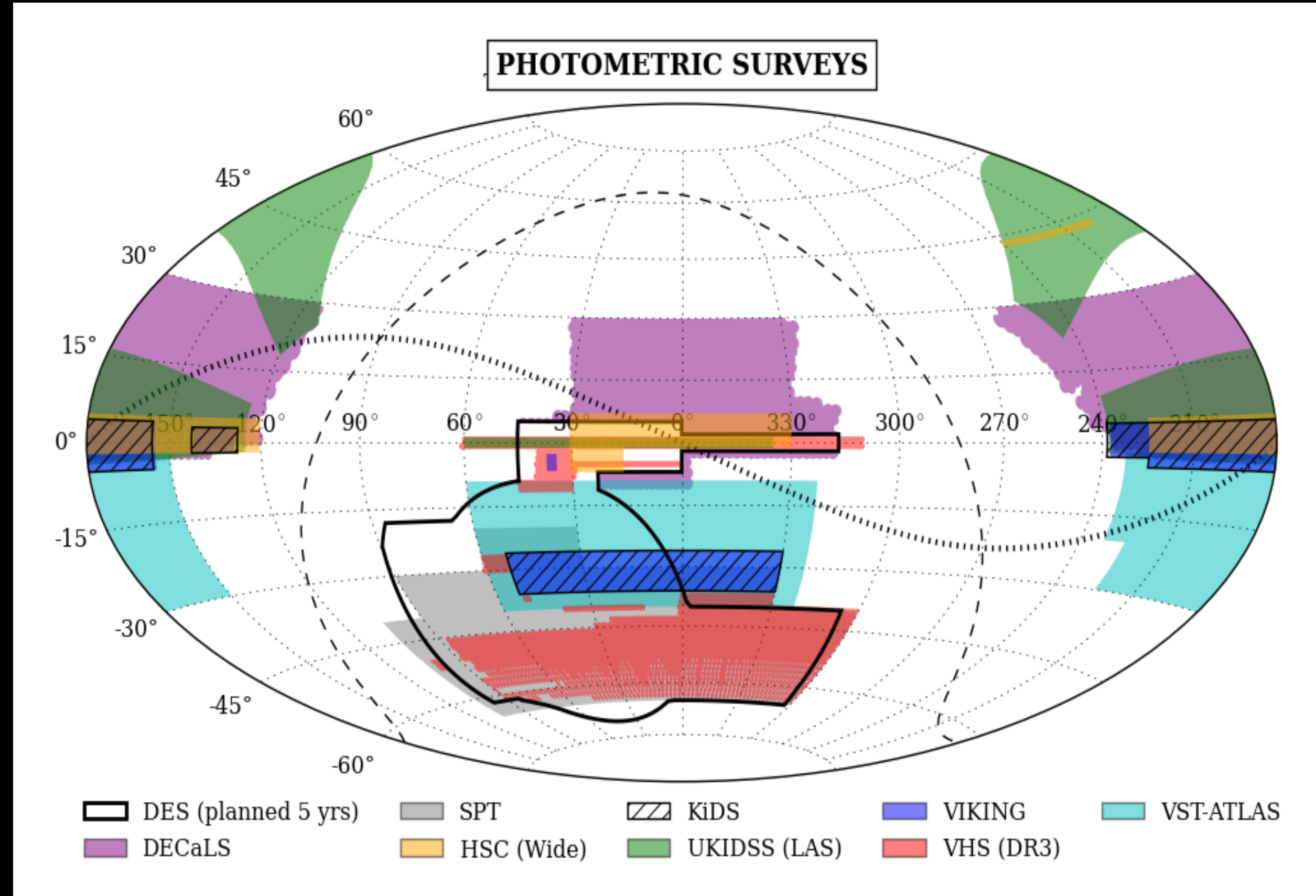


5000 square degrees, 5 optical filters

Animation: Dillon Brout

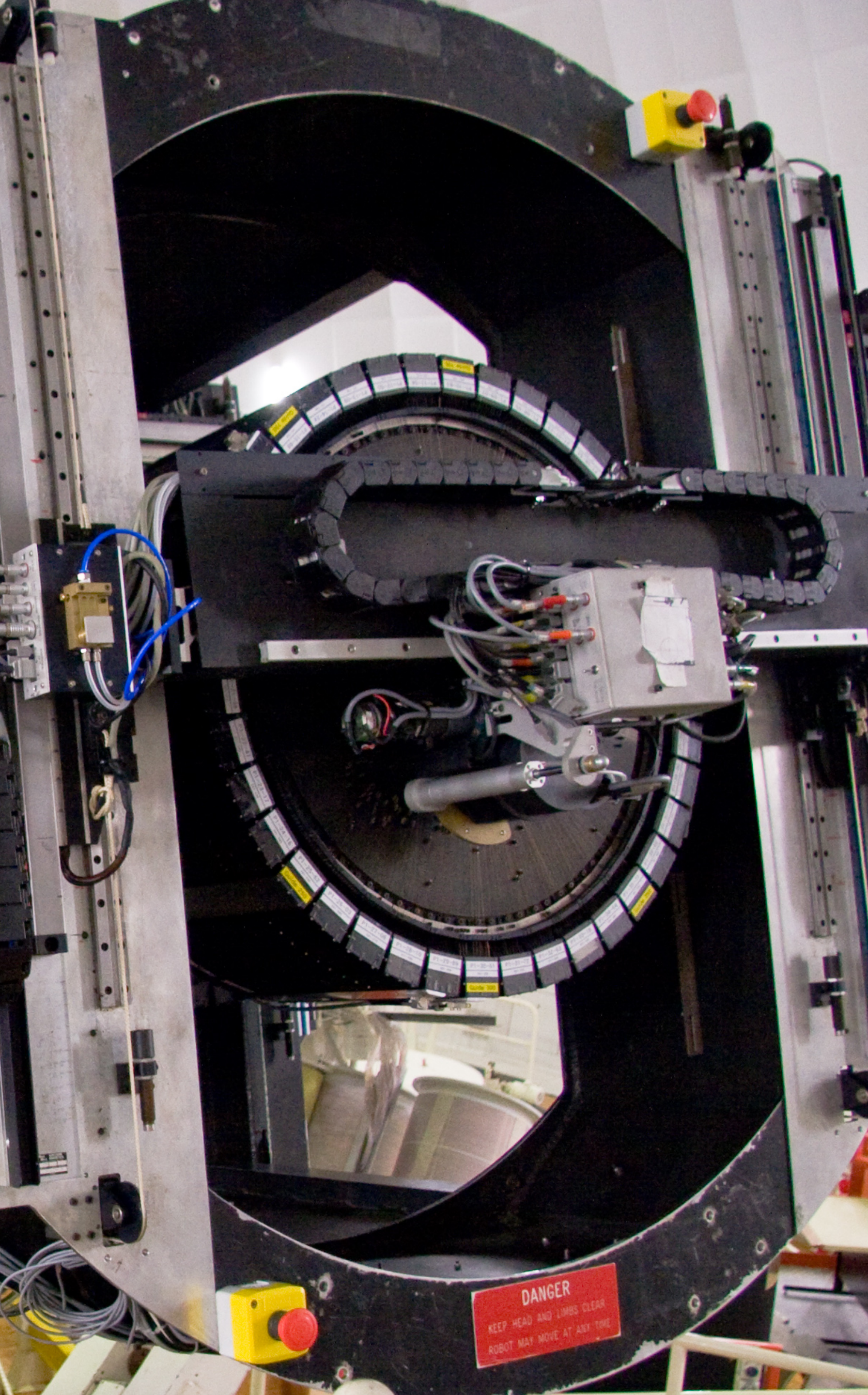


# OVERLAPPING SURVEYS



**OzDES fields**





2dF, AAT, Australia

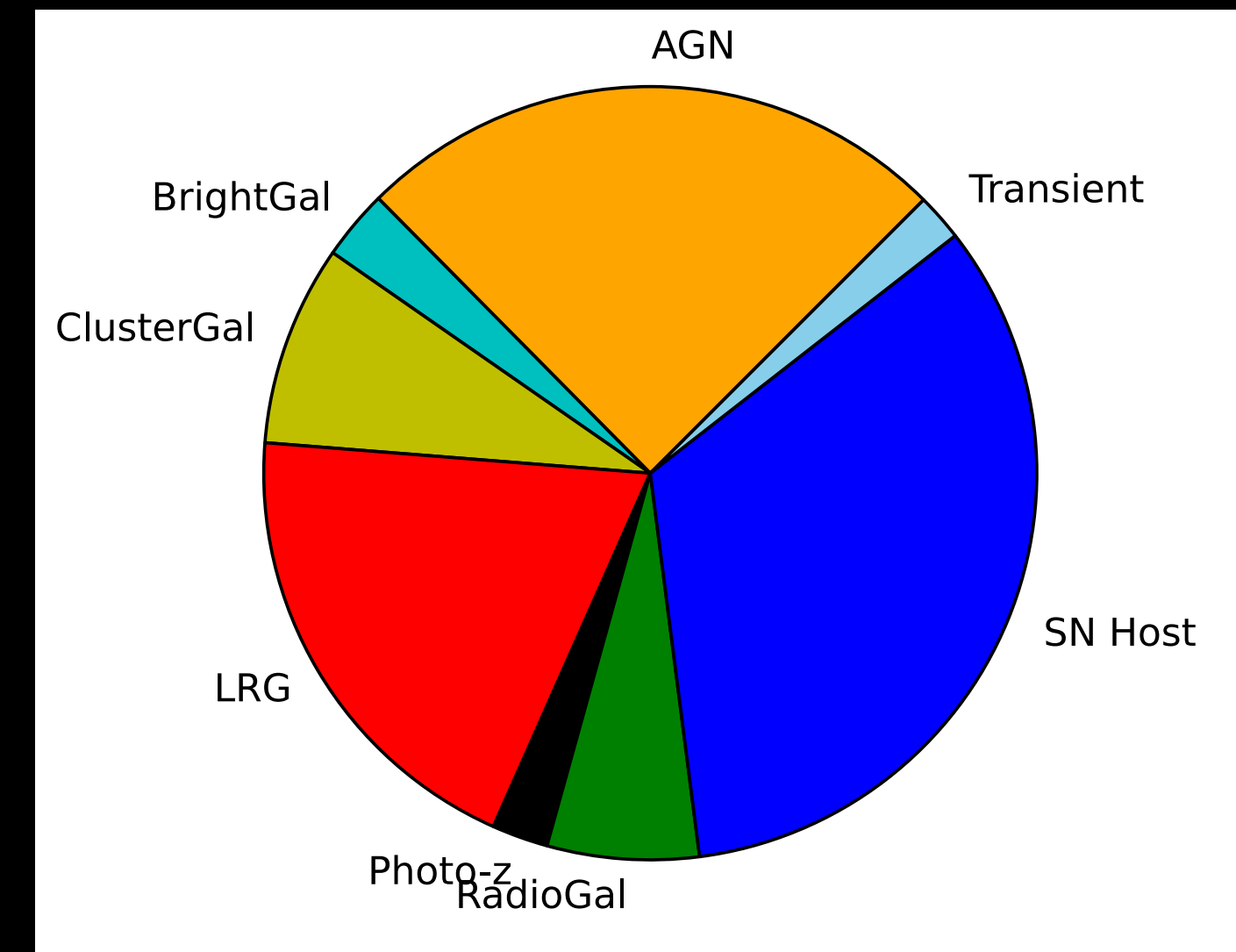


Supernovae  
AGN reverberation mapping  
Radio galaxies  
Photo-z calibration

~20 researchers  
5+1 years (from 2013)  
100 Nights  
30 square degrees

We like collaboration...  
contact us!

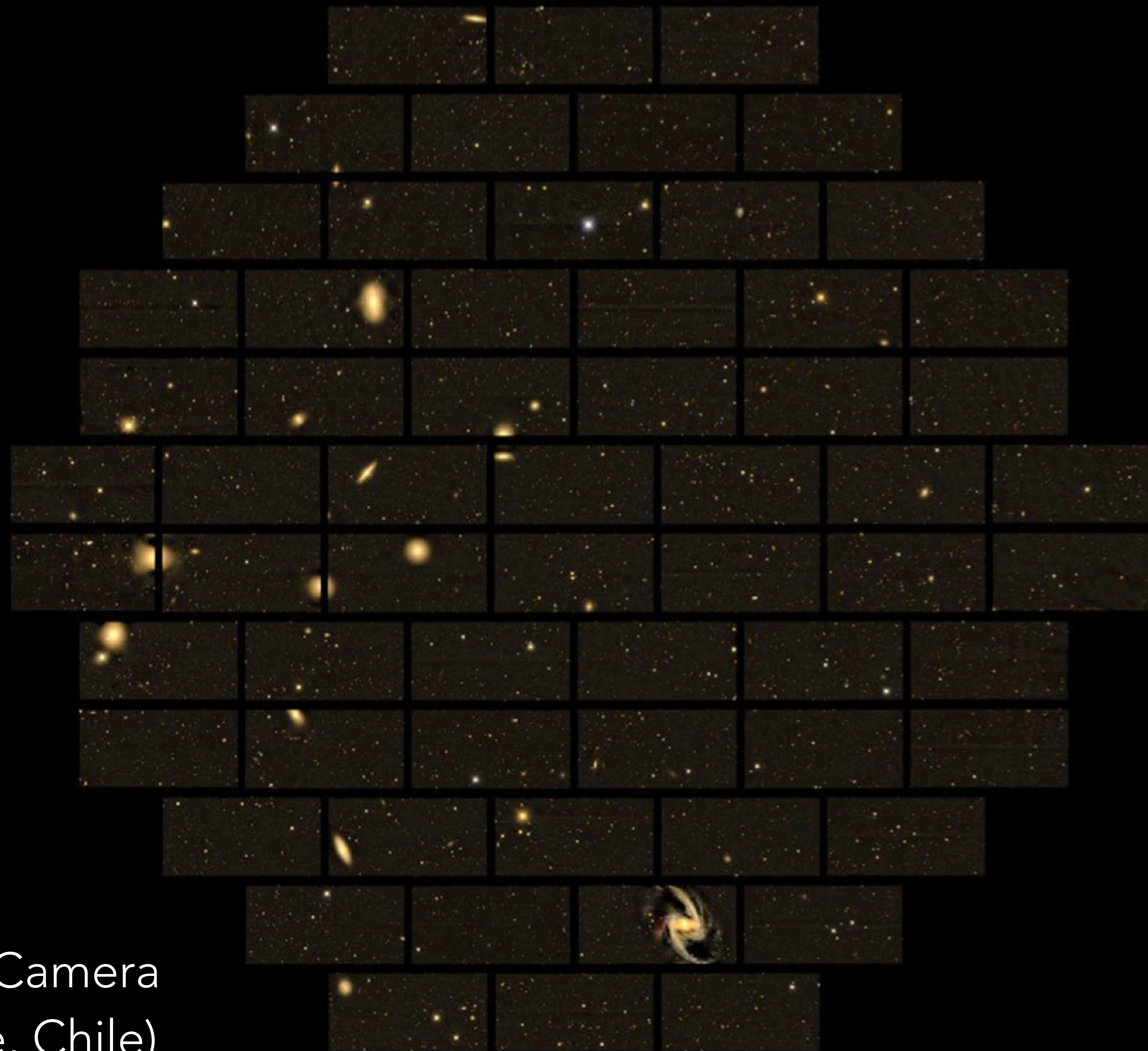
many types  
of targets



~3000  
supernova  
host galaxies

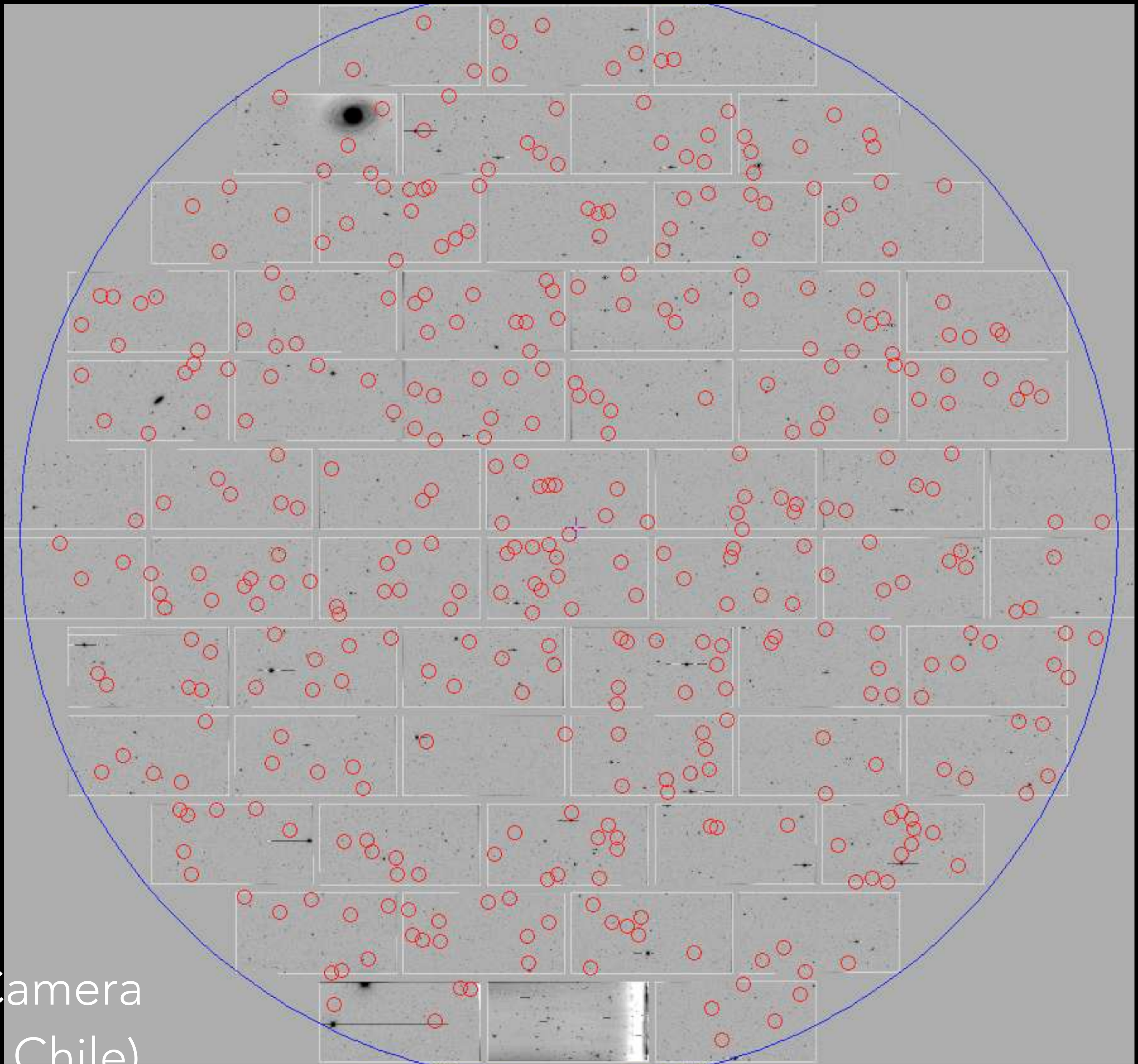
~800 AGN  
time-lapse





The Dark Energy Camera  
(Blanco telescope, Chile)





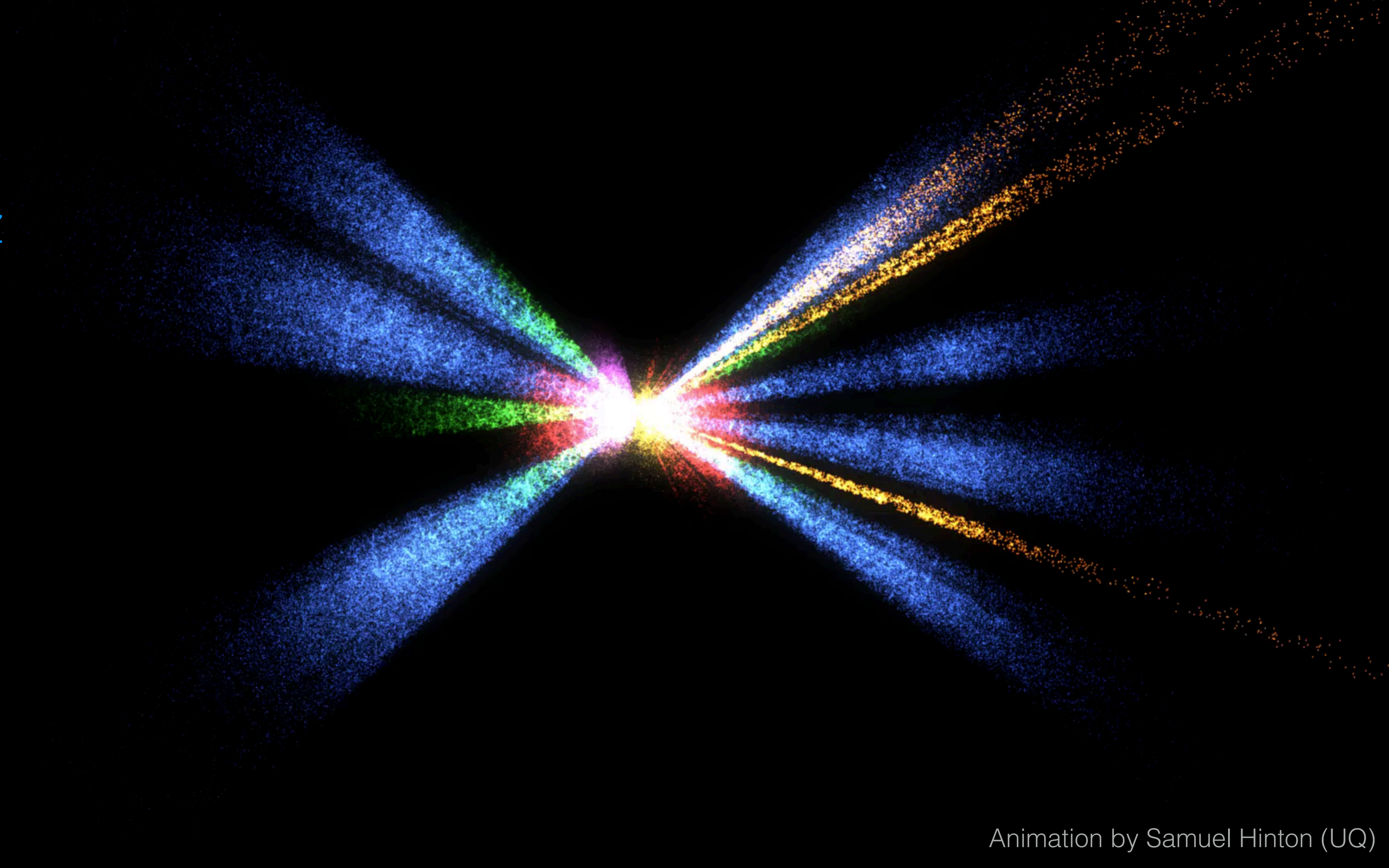
2 degree field spectrograph (Anglo-Australian Telescope)

*superimposed on*

The Dark Energy Camera (Blanco telescope, Chile)

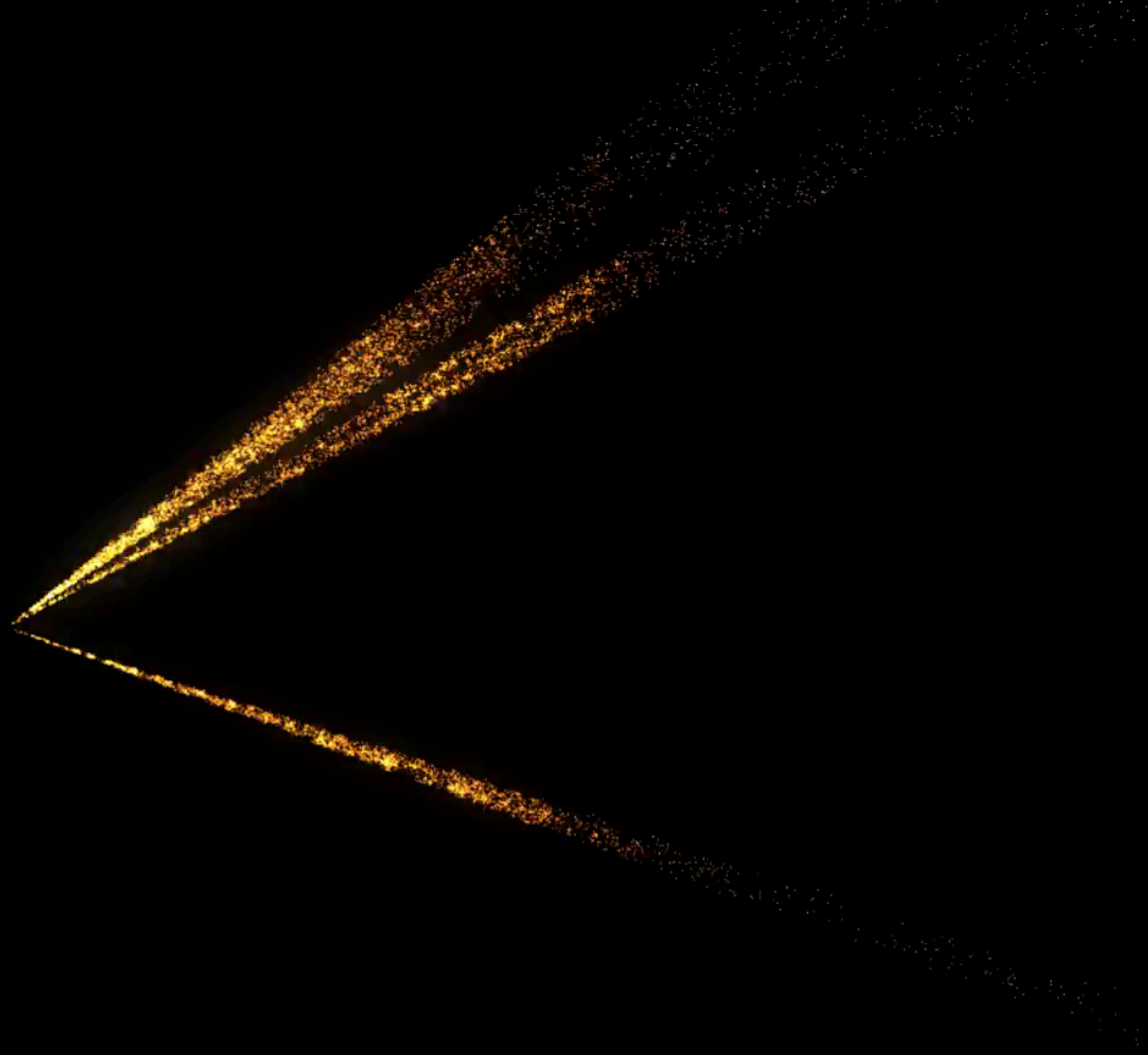


6dF  
2dF  
SDSS  
GAMA  
WiggleZ  
OzDES





OzDES

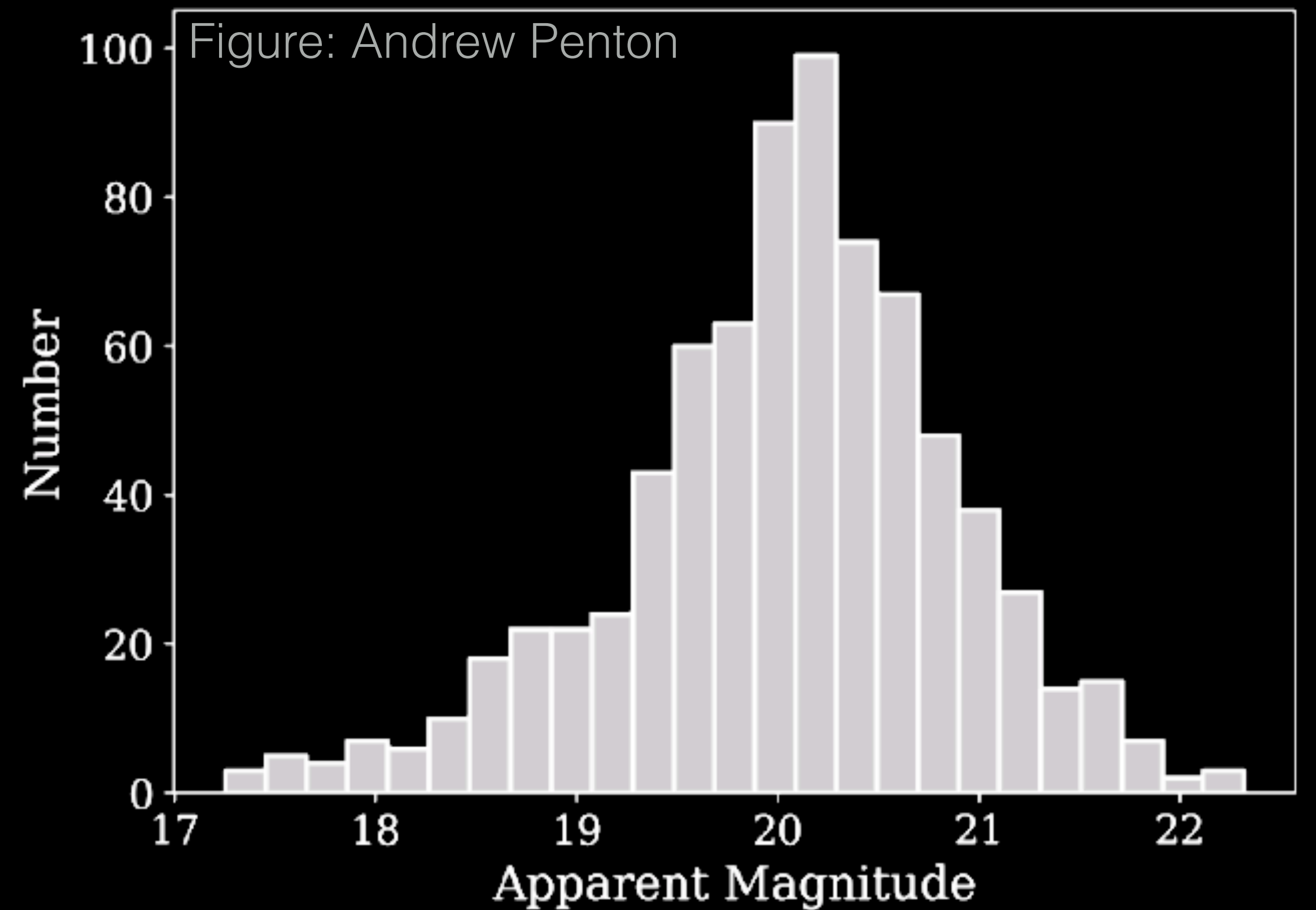
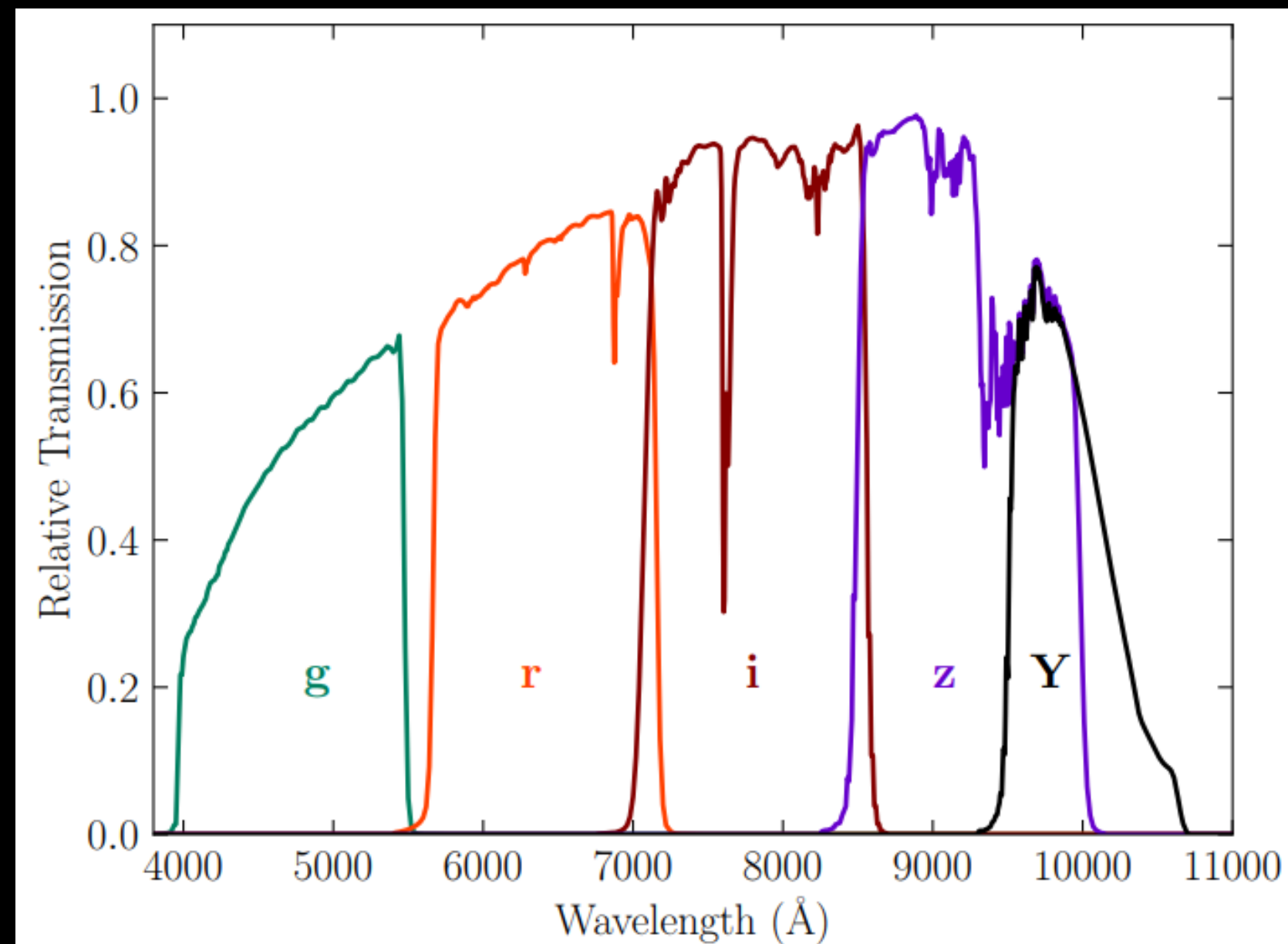




# OZDES REVERBERATION MAPPING PROGRAM

## Monitoring 771 AGN

- 6 years, **2013-2019**, each July to January
- ~ **Weekly photometry** with DECam
  - Make continuum light curves
  - grizY bands (from 400nm to 1080nm)



Magnitude distribution of OzDES targets  
(r-band)

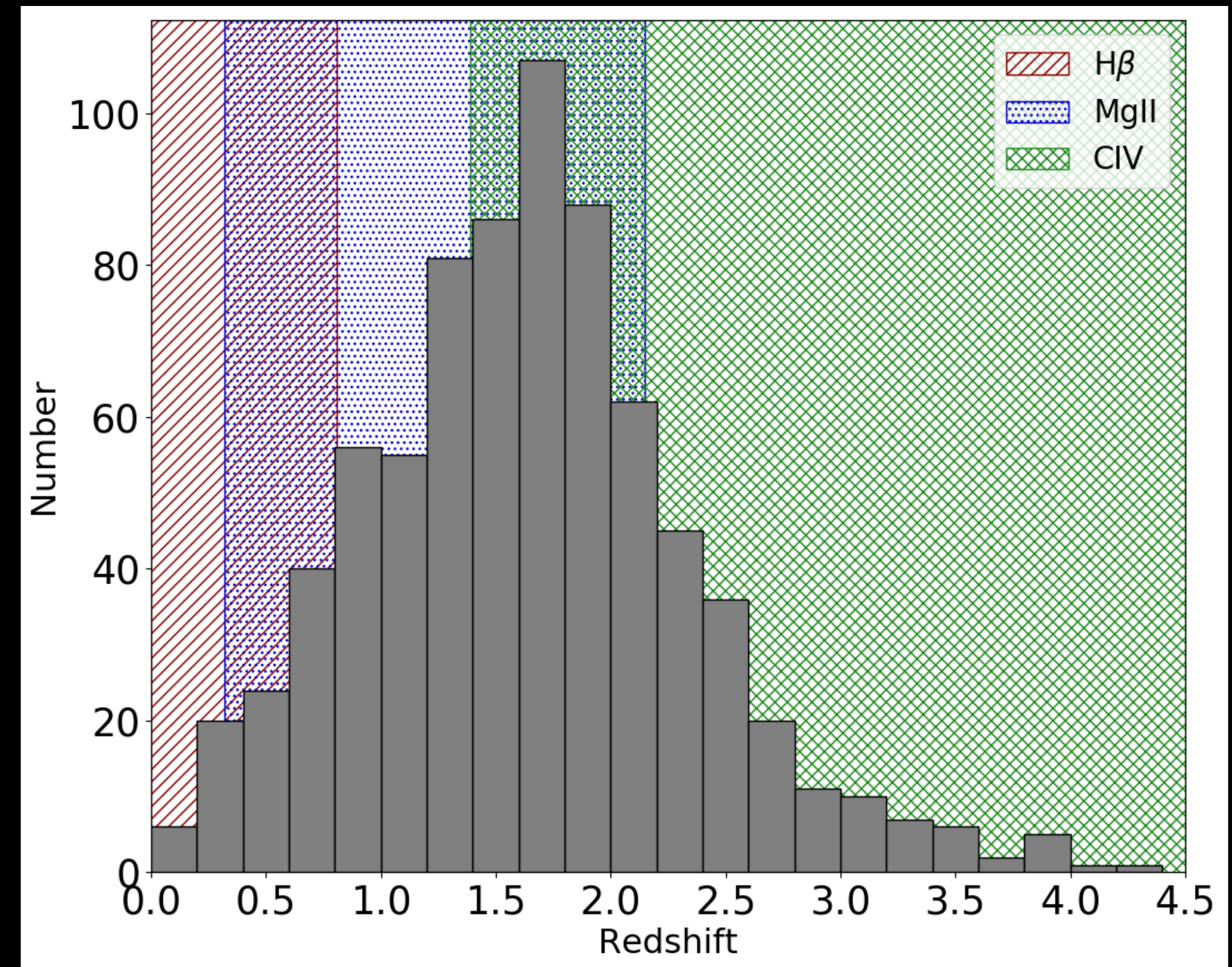


# OZDES REVERBERATION MAPPING PROGRAM

## Monitoring 771 AGN

- 6 years, **2013-2019**, each July to January
- ~ **Weekly photometry** with DECam
  - Make continuum light curves
  - grizY bands (from 400nm to 1080nm)
- ~ **Monthly spectroscopy** with 2dF on the AAT
  - H $\beta$  , MgII, CIV emission lines, depending on z
  - (H $\alpha$  , CIII also being investigated)
  - 370-880 nm

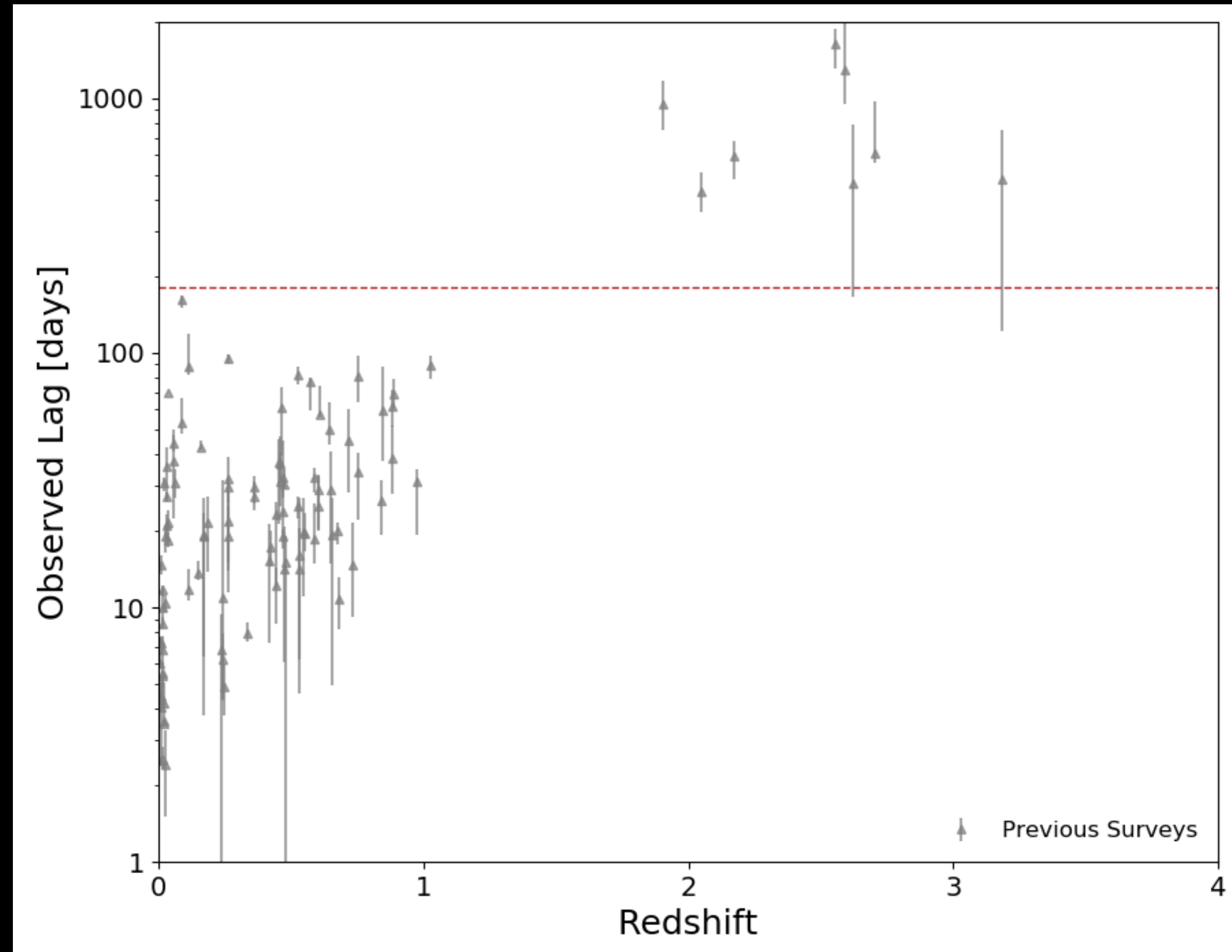
Expect 30% success rate (King et al. 2015)



Redshift distribution of OzDES targets coloured by which lines are in our spectral range



# OZDES IN CONTEXT - EXISTING DATA



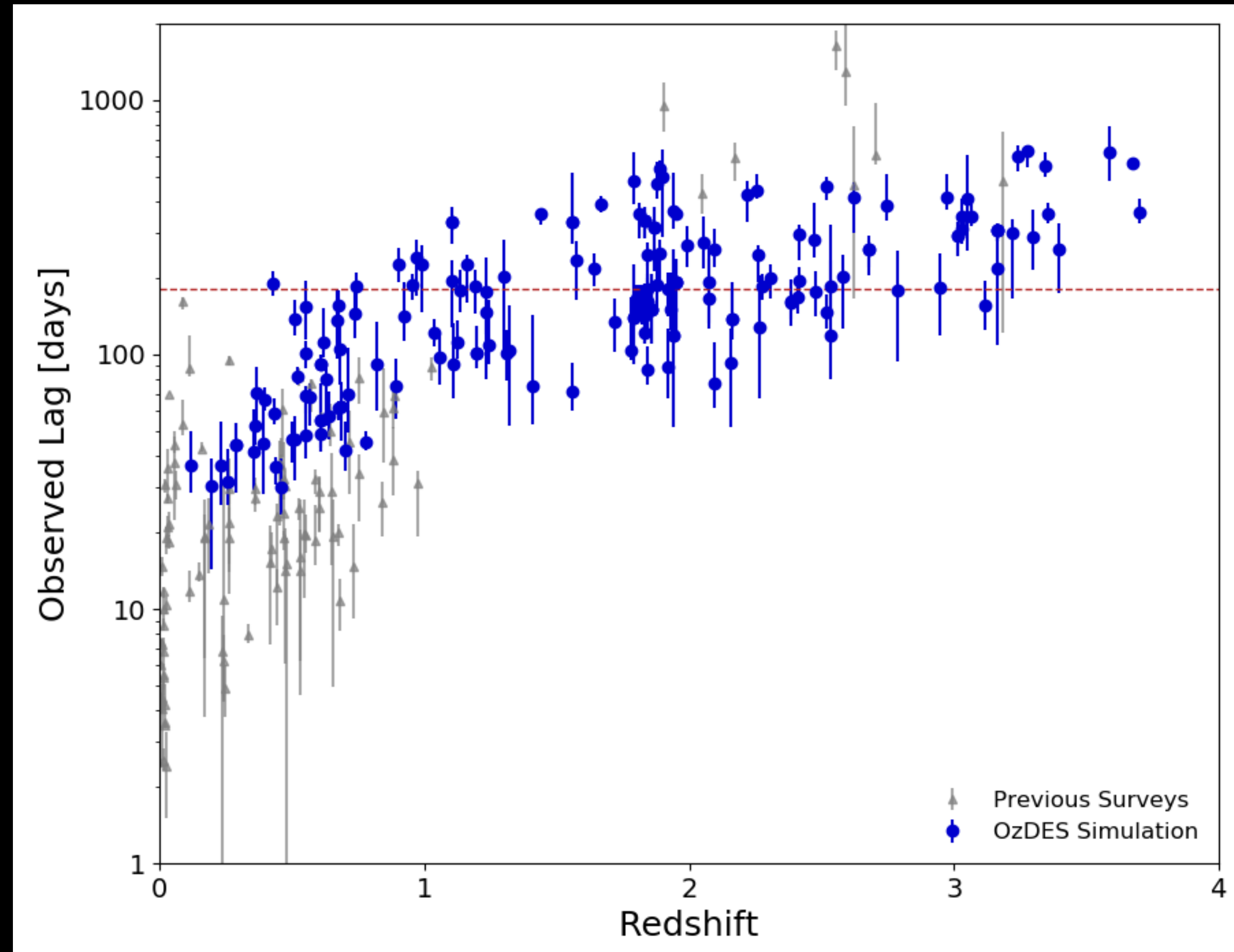
Existing measurements from:

- Peterson et al 2006
- Kaspi et al 2007
- Grier et al 2013
- Trevese et al 2014
- Shen et al 2016
- Grier et al 2017
- Lira et al 2018



# OZDES IN CONTEXT - SIMULATION

OzDES simulation  
(King et al. 2015)



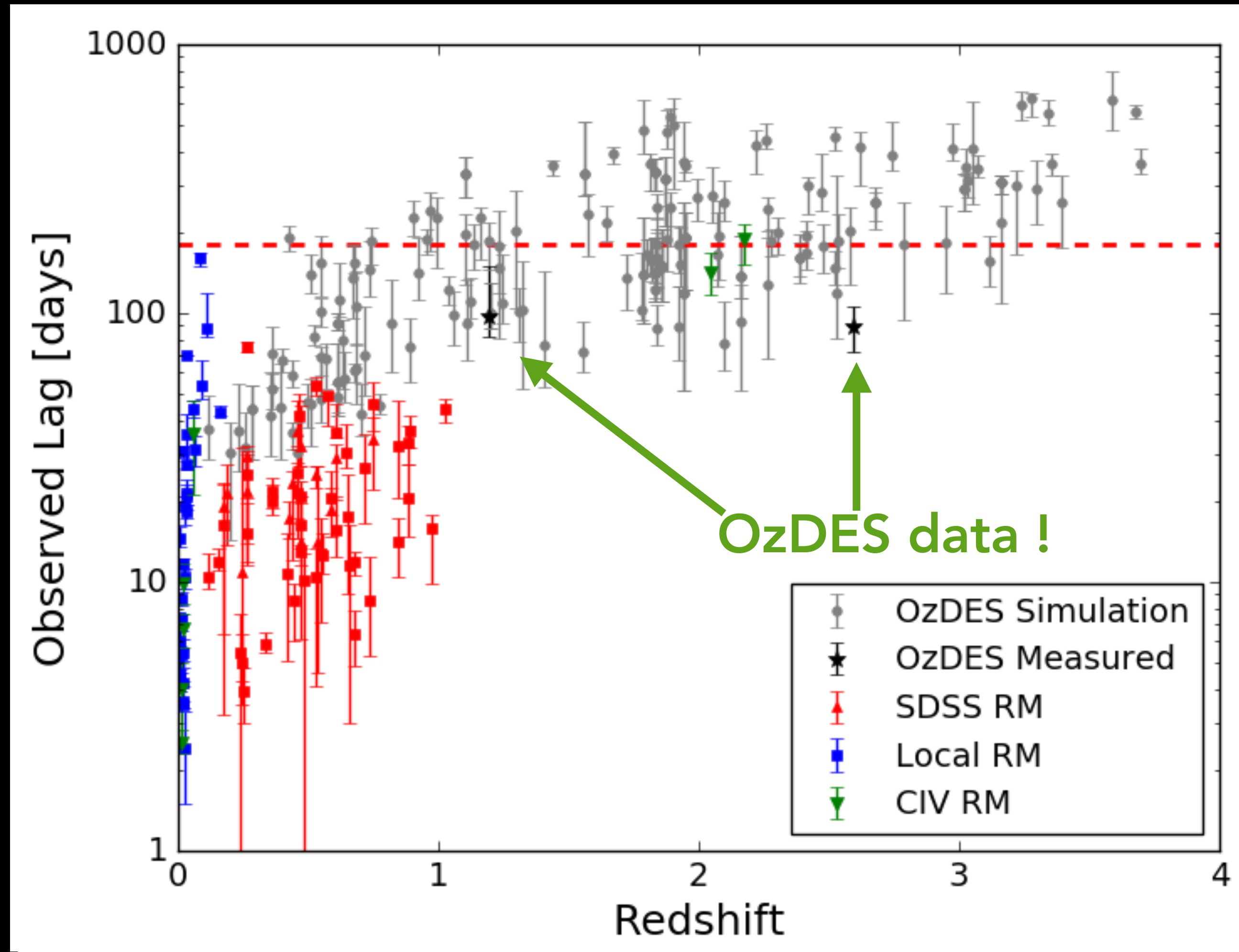
Existing measurements  
from:

- Peterson et al 2006
- Kaspi et al 2007
- Grier et al 2013
- Trevese et al 2014
- Shen et al 2016
- Grier et al 2017
- Lira et al 2018



# OZDES IN CONTEXT - FIRST RESULTS!!

OzDES simulation  
(King et al. 2015)



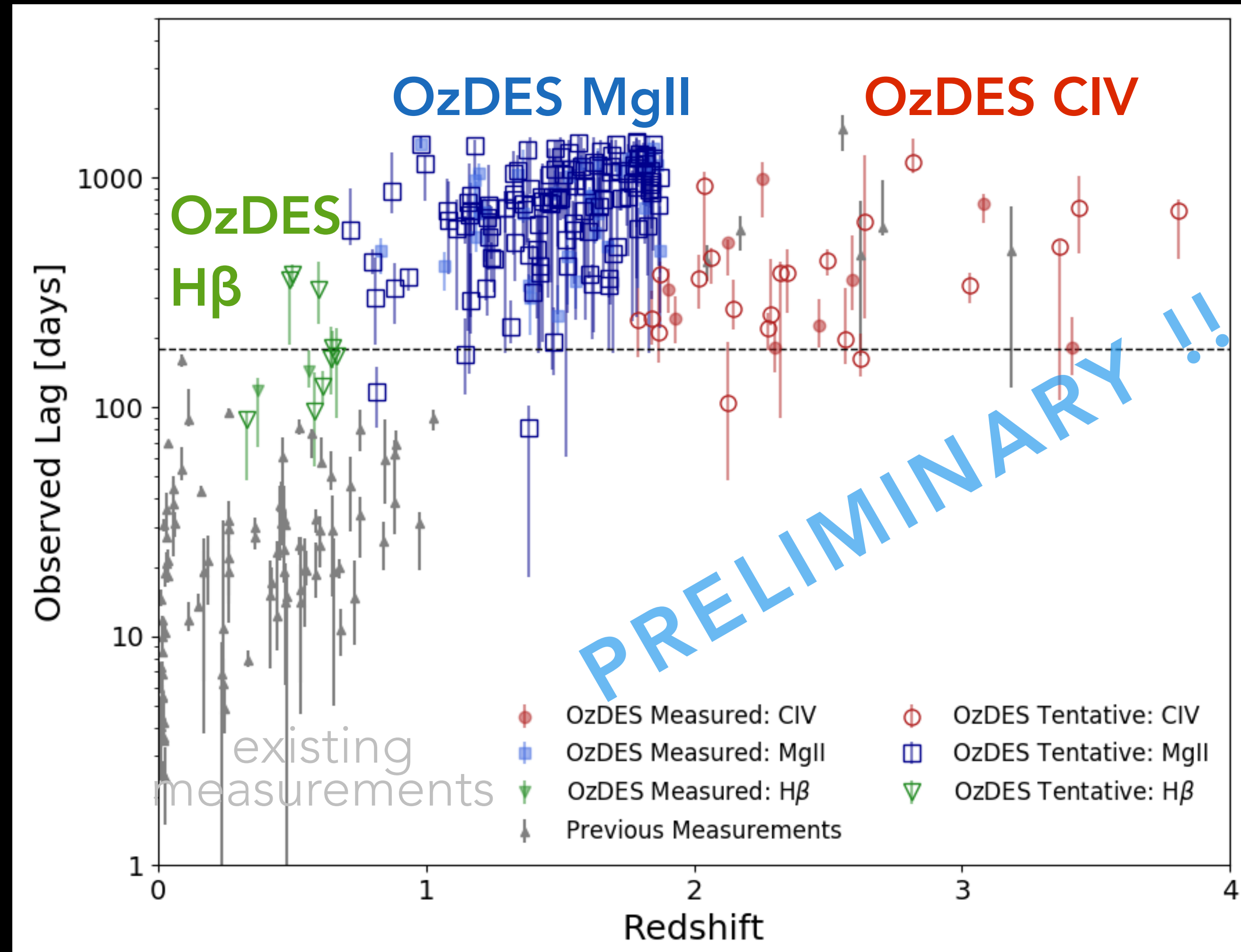
Existing measurements:

- Local
- SDSS
- CIV



# OZDES IN CONTEXT - UPCOMING RESULTS

OzDES data  
(in prep)

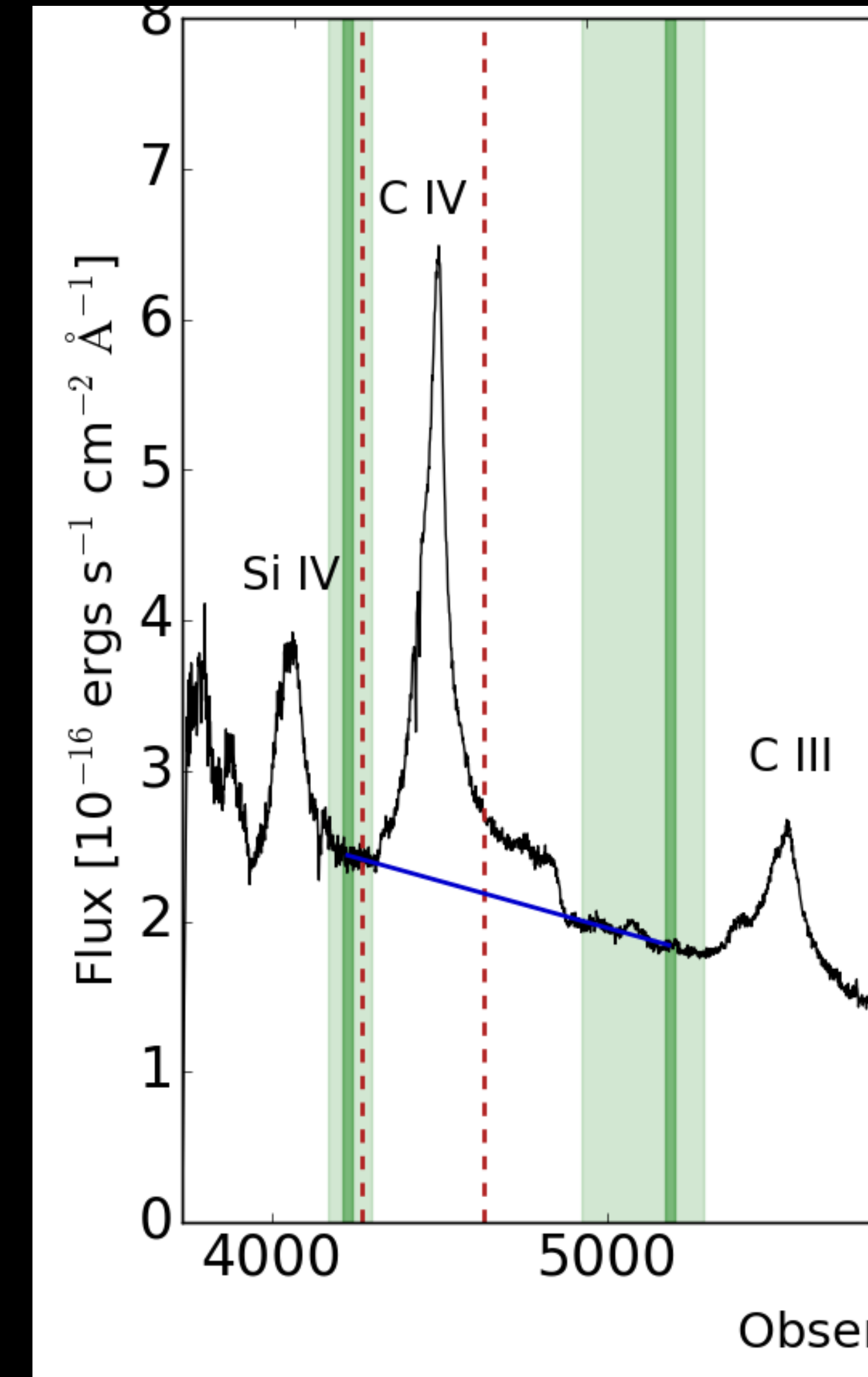
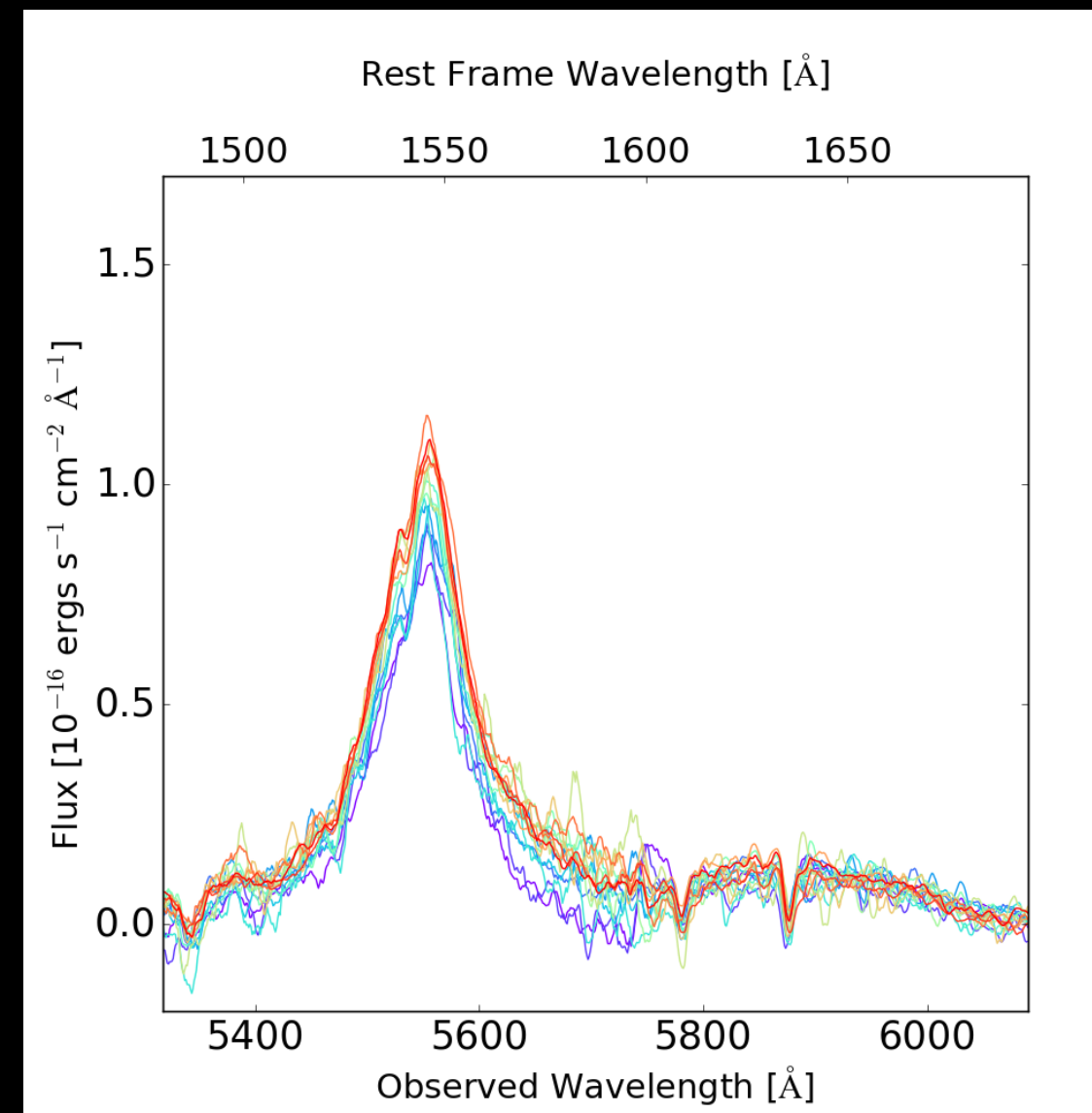
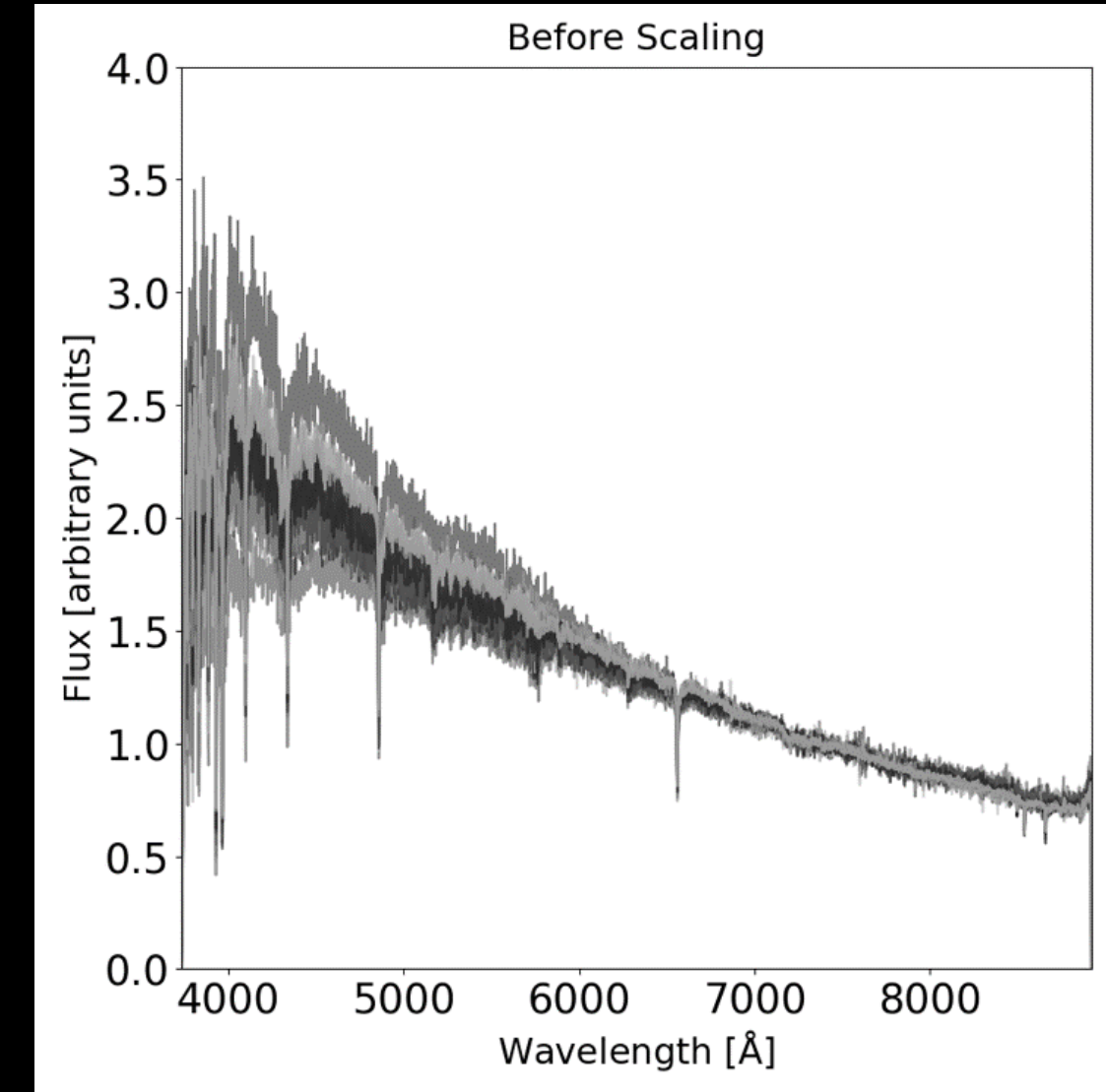


46 secure + 151 probable new lag measurements



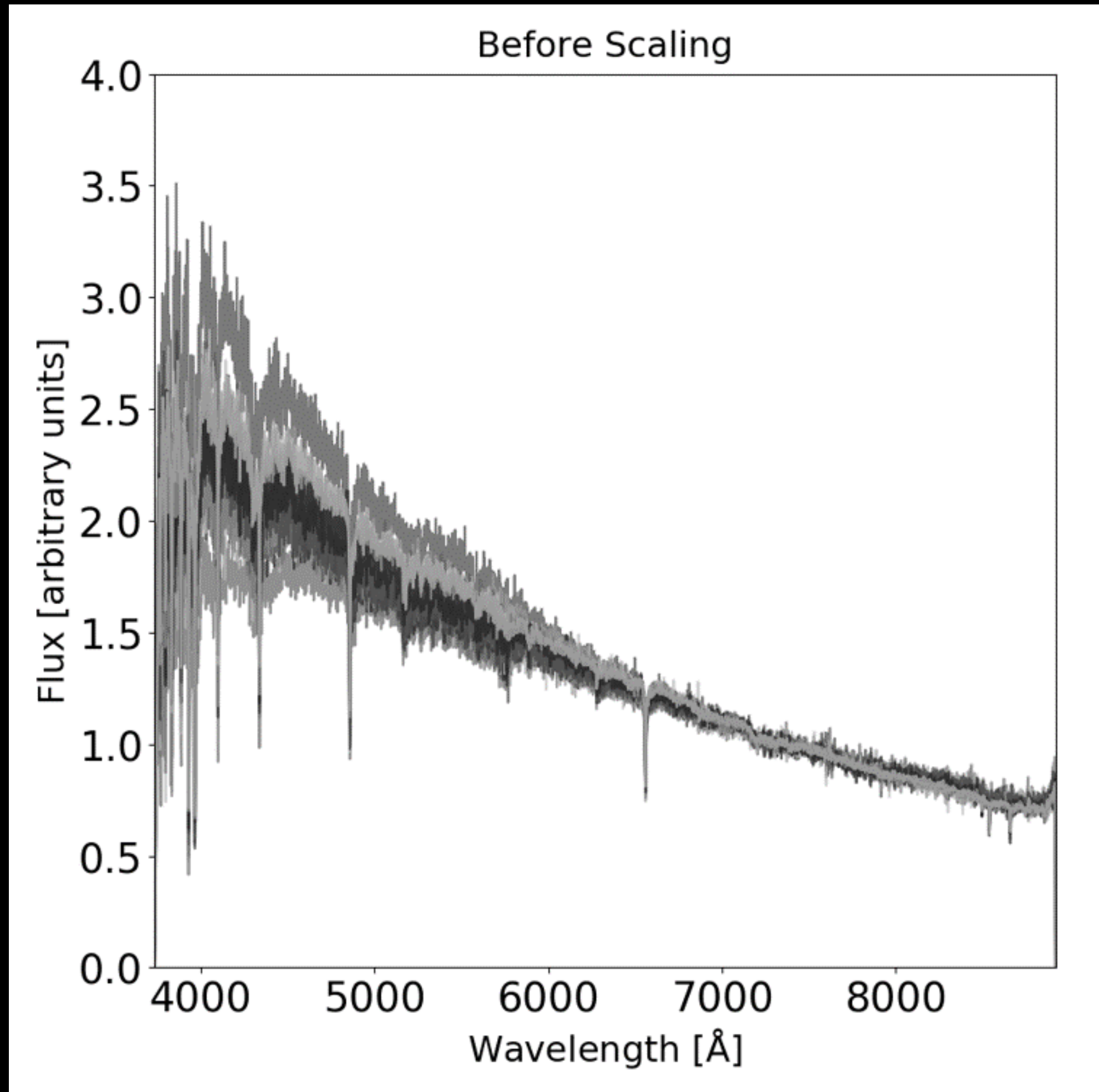
# THE OZDES RM PIPELINE

- Spectrophotometric calibration
  - [github.com/jhoormann/OzDES\\_calibSpec](https://github.com/jhoormann/OzDES_calibSpec)
- Local continuum subtraction
  - Integrate emission lines to get flux
  - [github.com/jhoormann/OzDES\\_makeLC](https://github.com/jhoormann/OzDES_makeLC)
- Calculate the line flux
- Cross correlate continuum and line light curves to get the lag

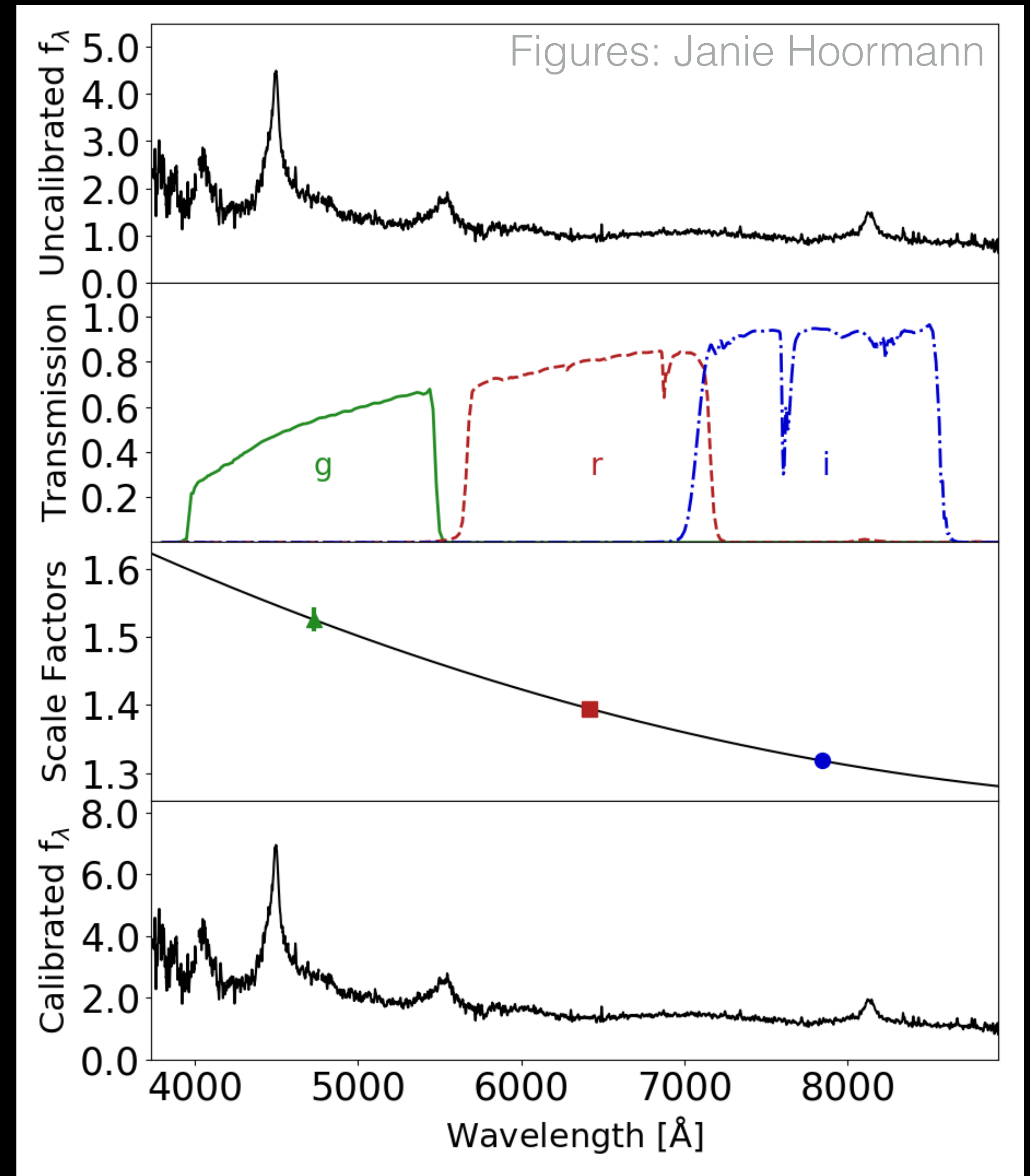




# CALIBRATE THE SPECTRUM



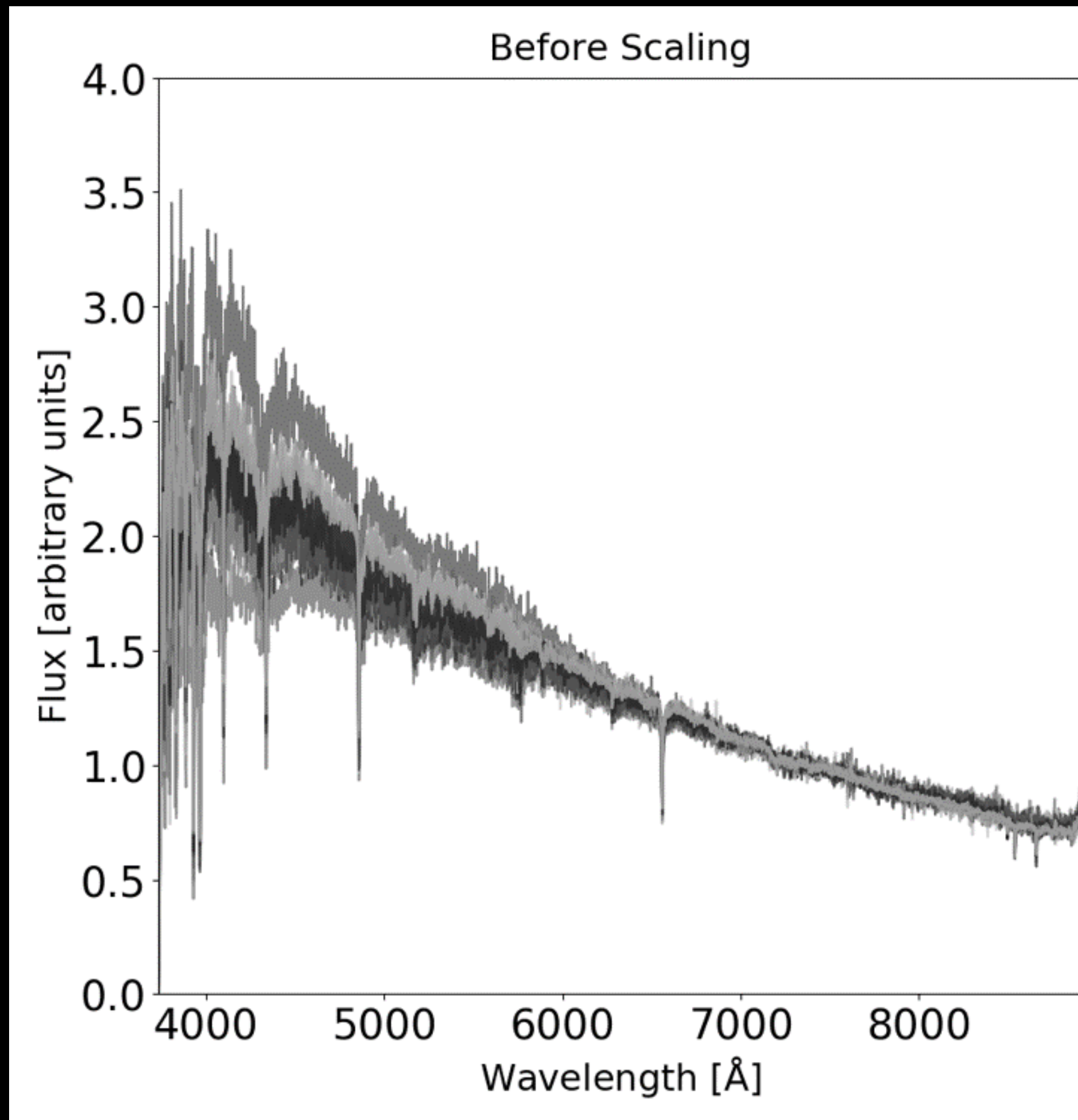
F-stars used for calibration  
Raw spectra show lots of variation



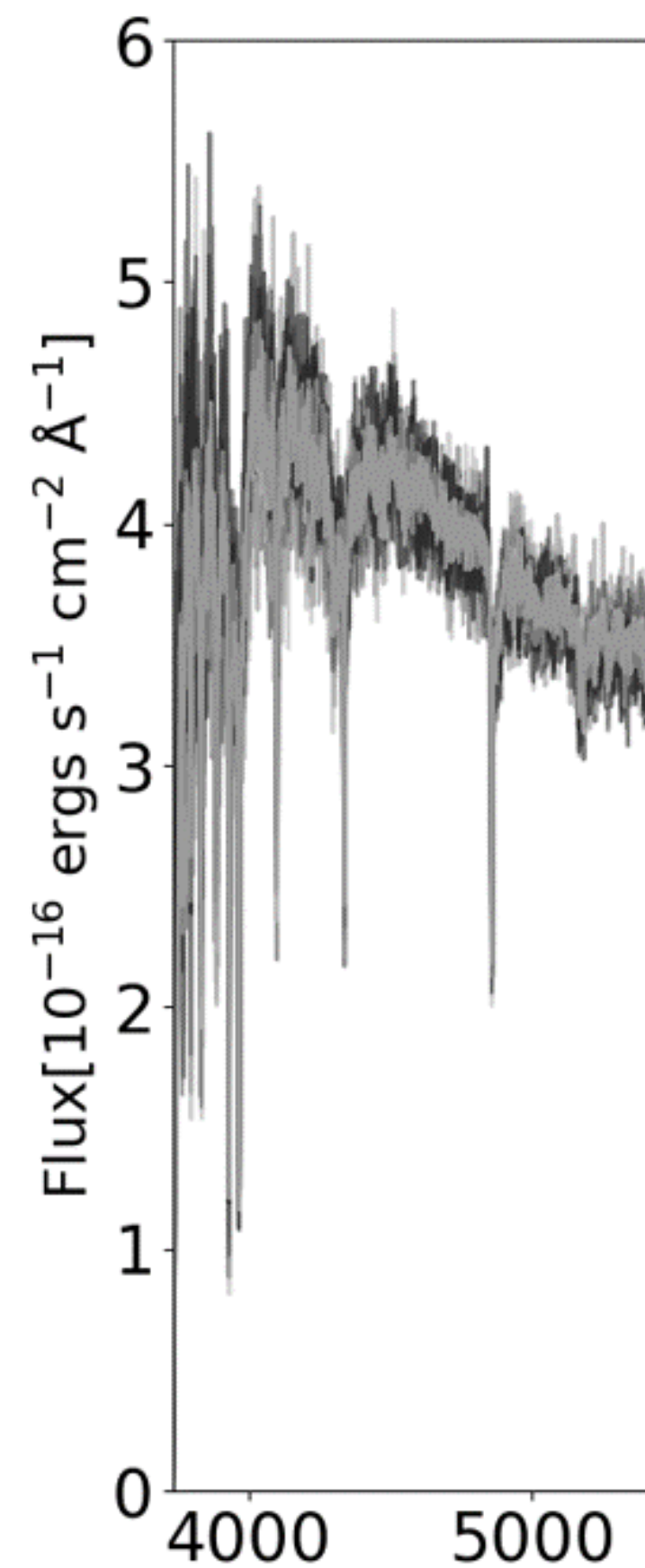
Compare magnitude measured from OzDES  
spectrum to nearest DES observation



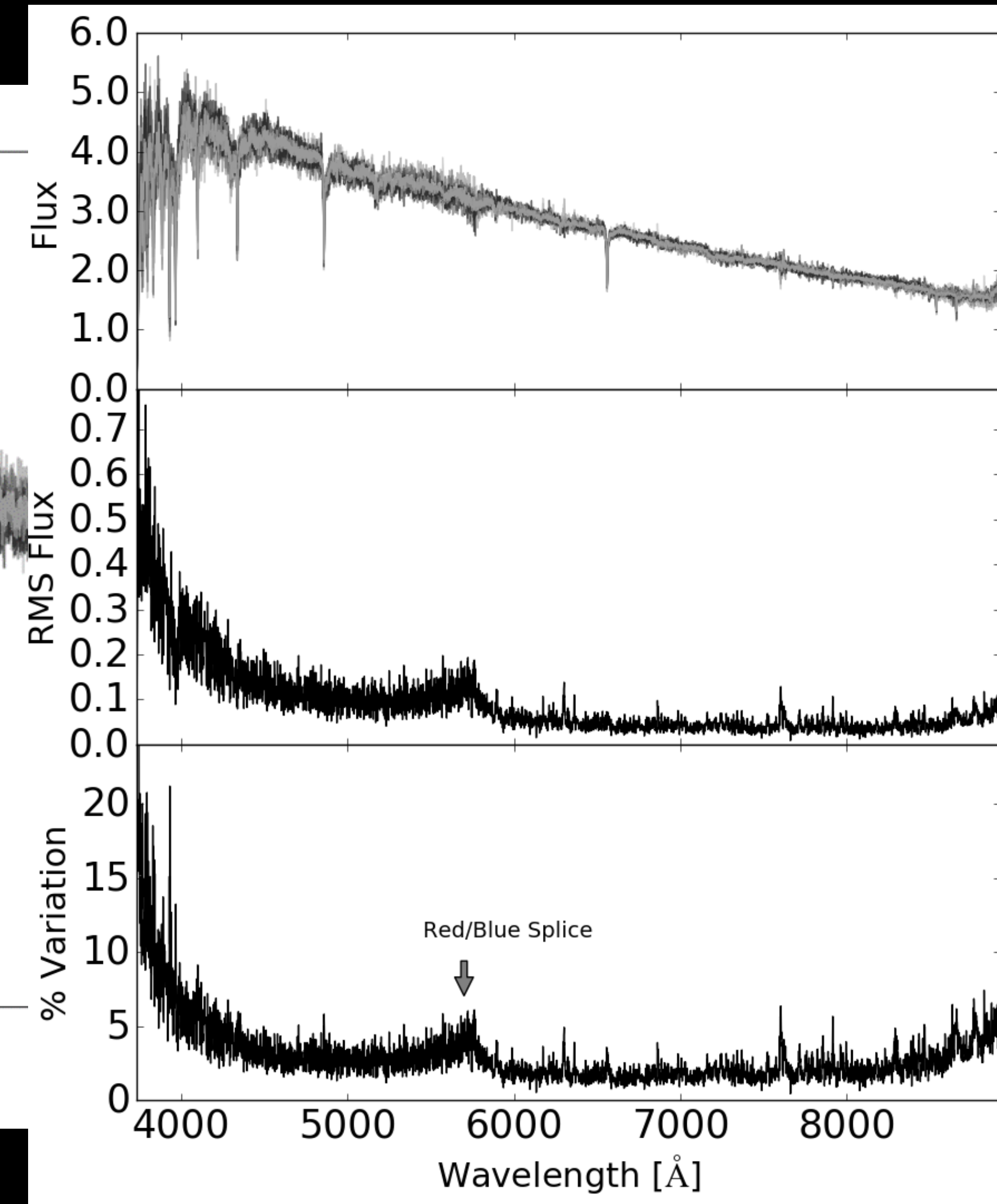
# CALIBRATE THE SPECTRUM



F-stars used for calibration  
Raw spectra show lots of variation

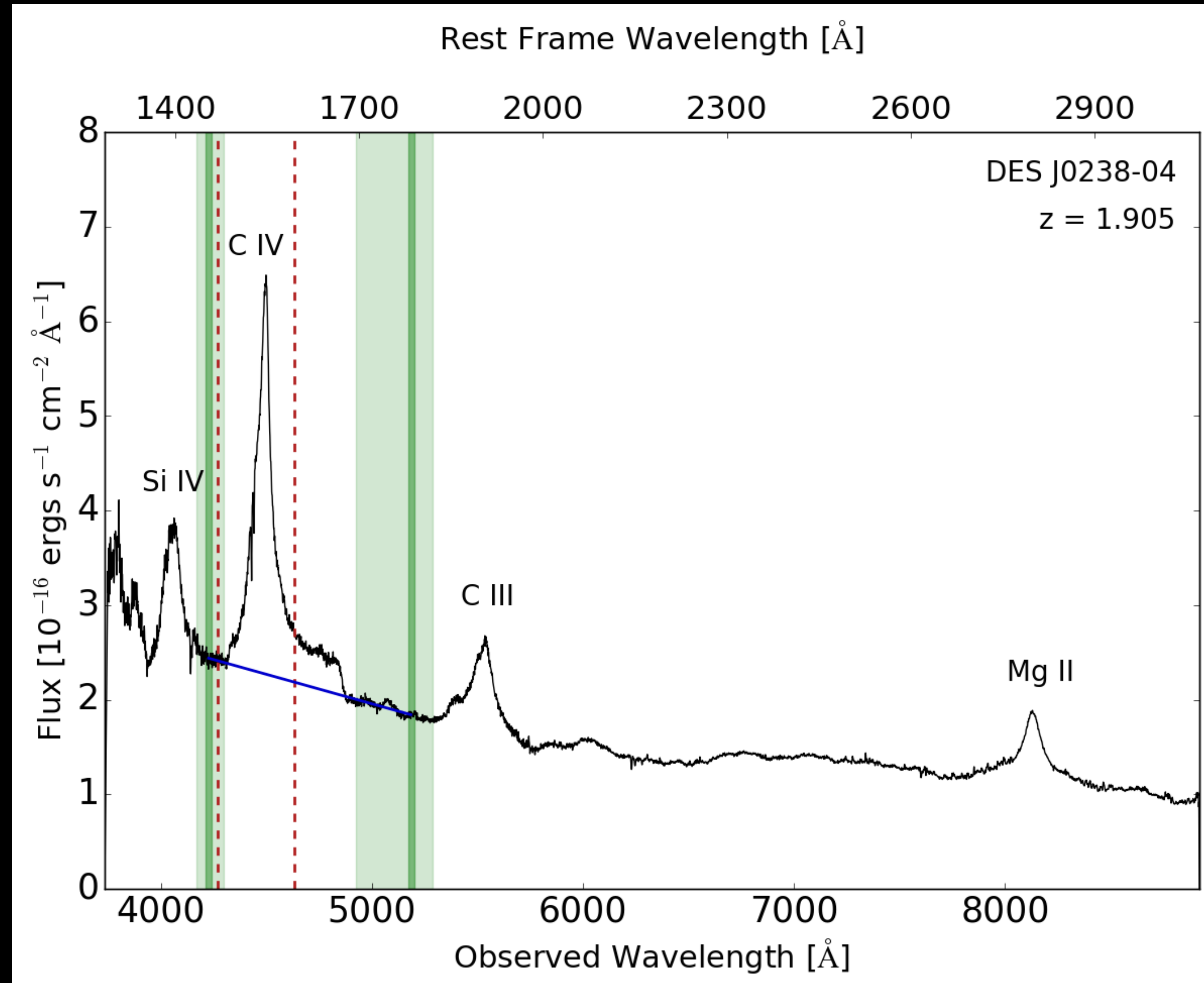


Calibration removes most of the variation





# REMOVE THE CONTINUUM

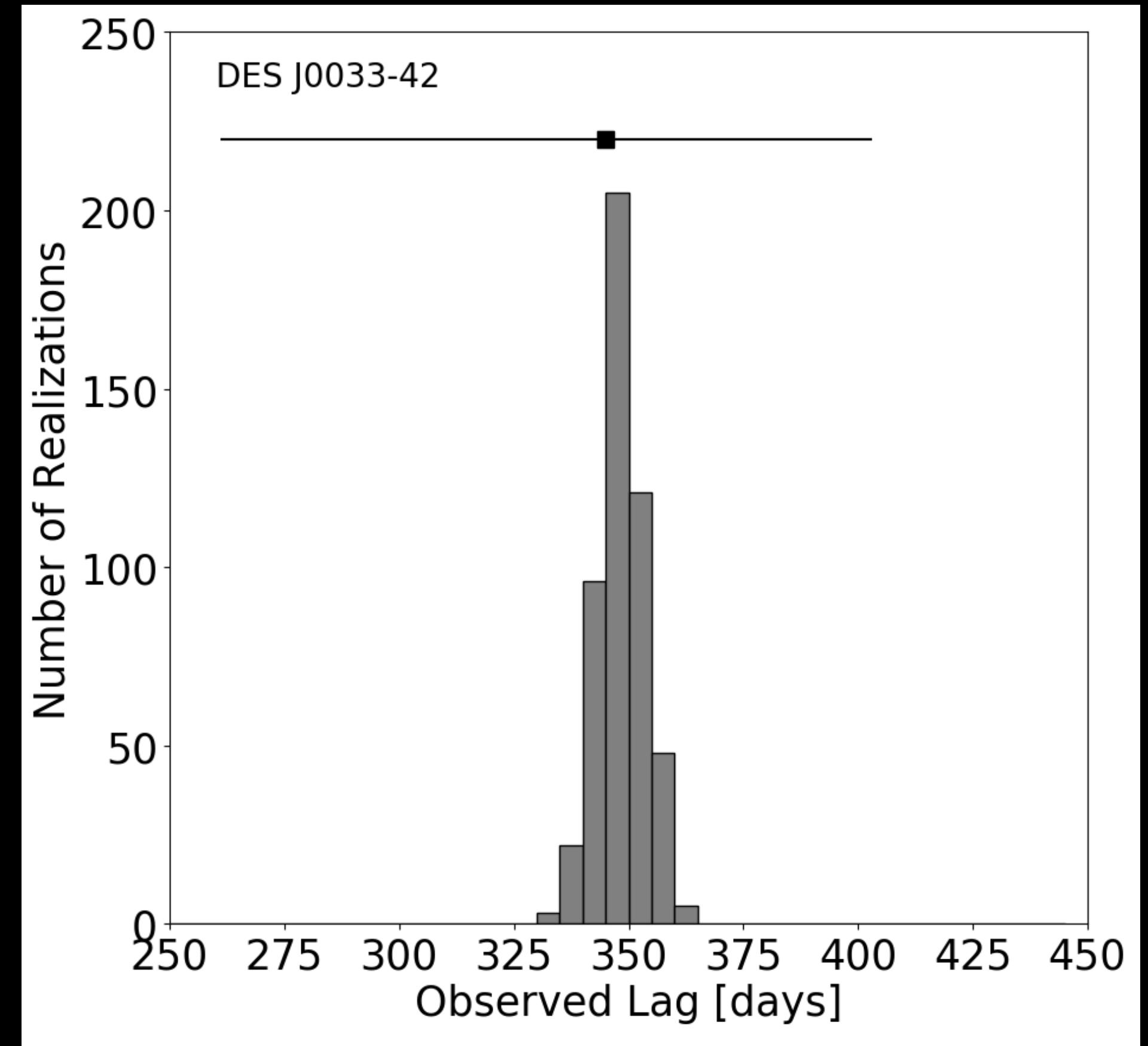
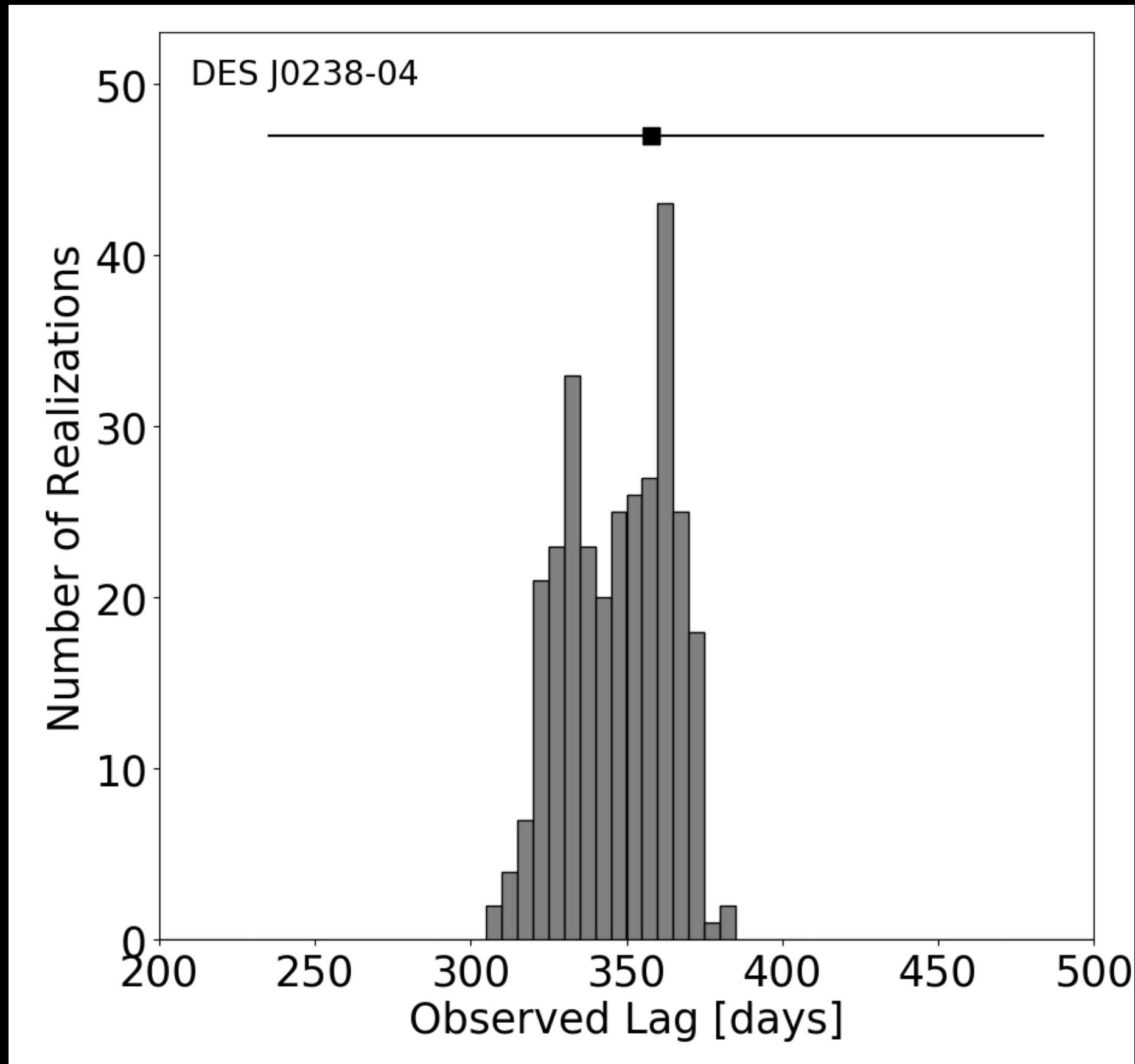


The continuum subtraction is the largest source of uncertainty in the line flux measurement (3.4% and 7.8%)

Figure: Janie Hoormann



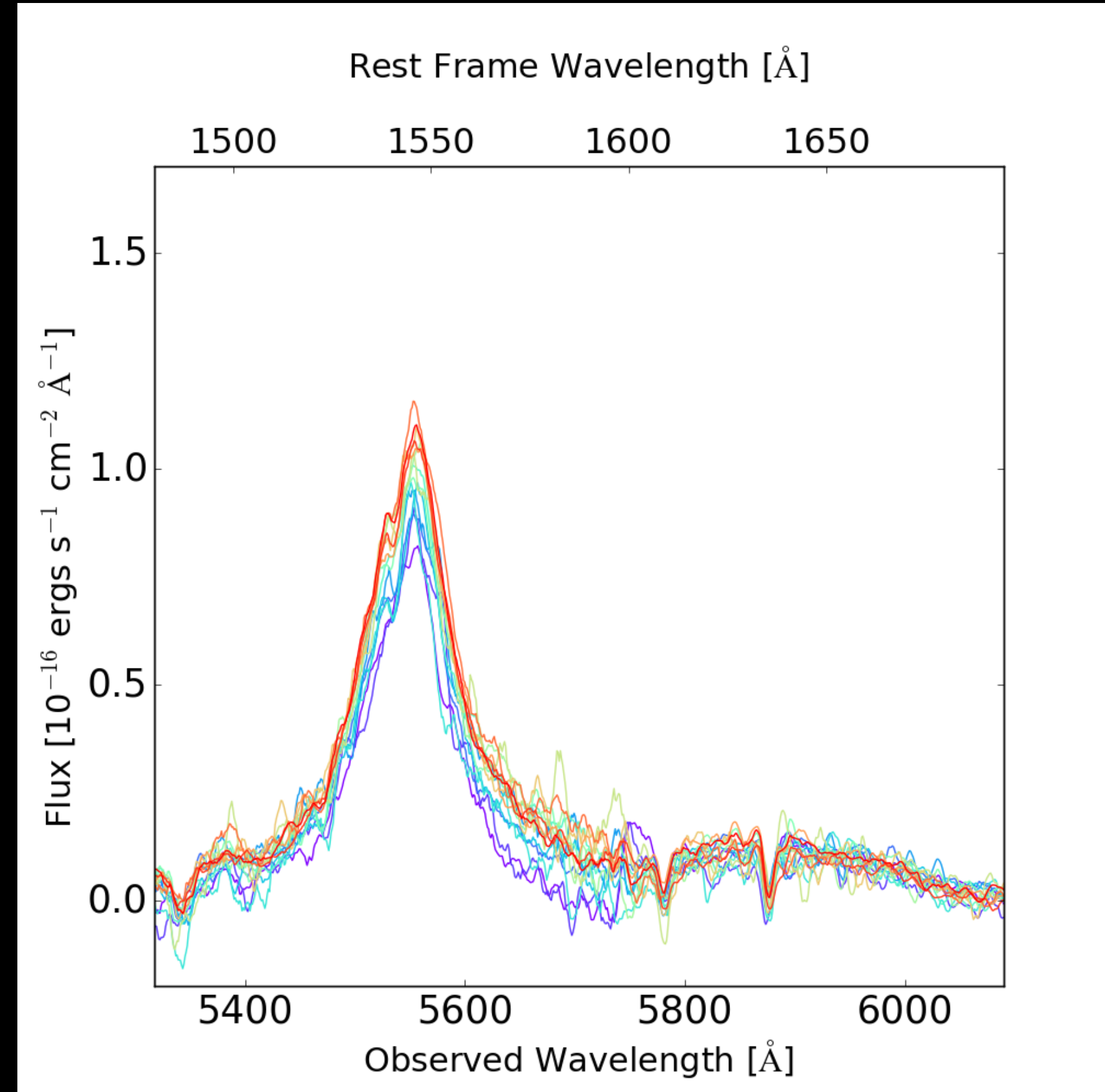
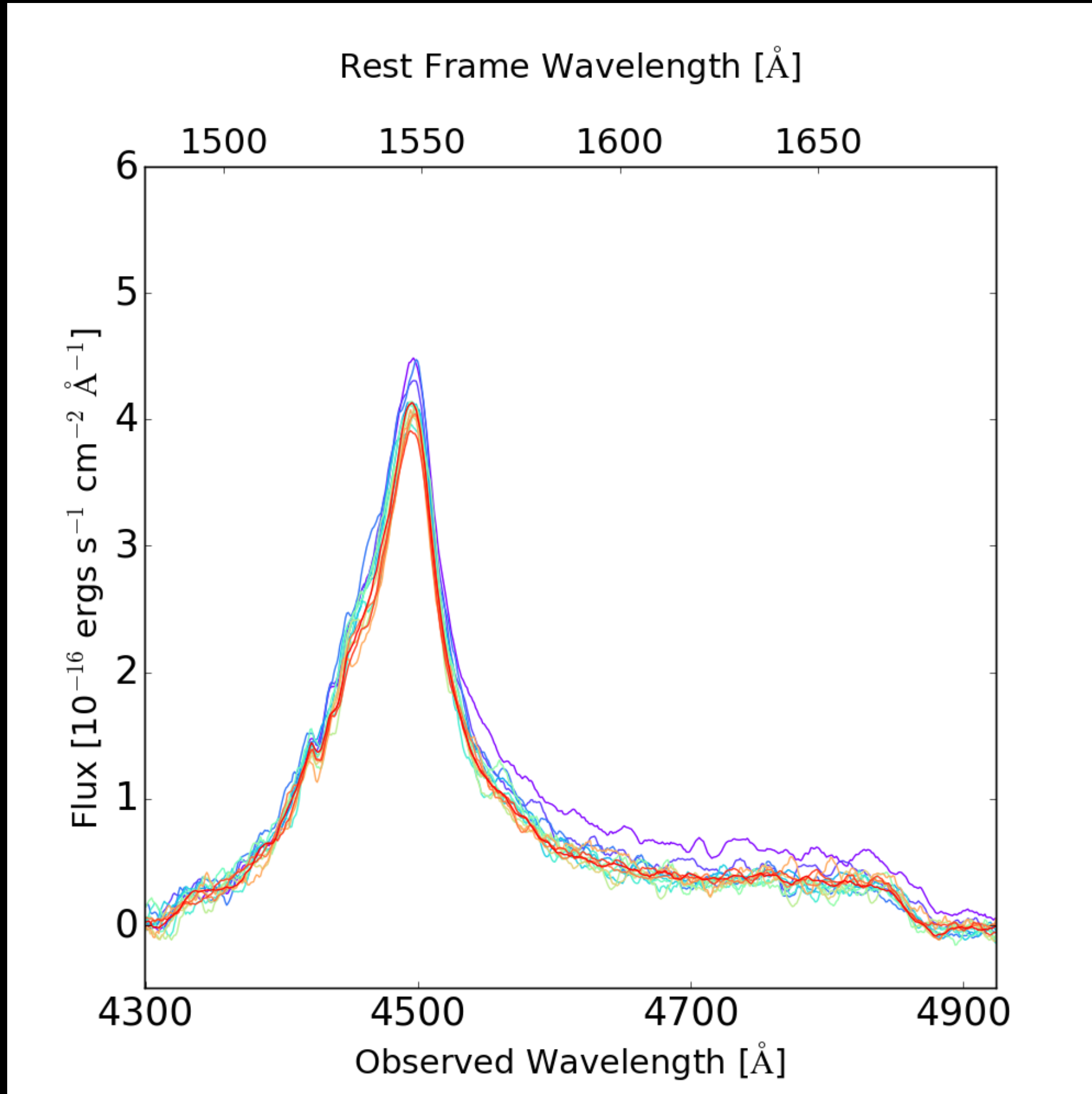
# WHAT IF YOU CHANGE THE INTEGRATION WINDOW?



The choice of integration window doesn't substantially change the result.

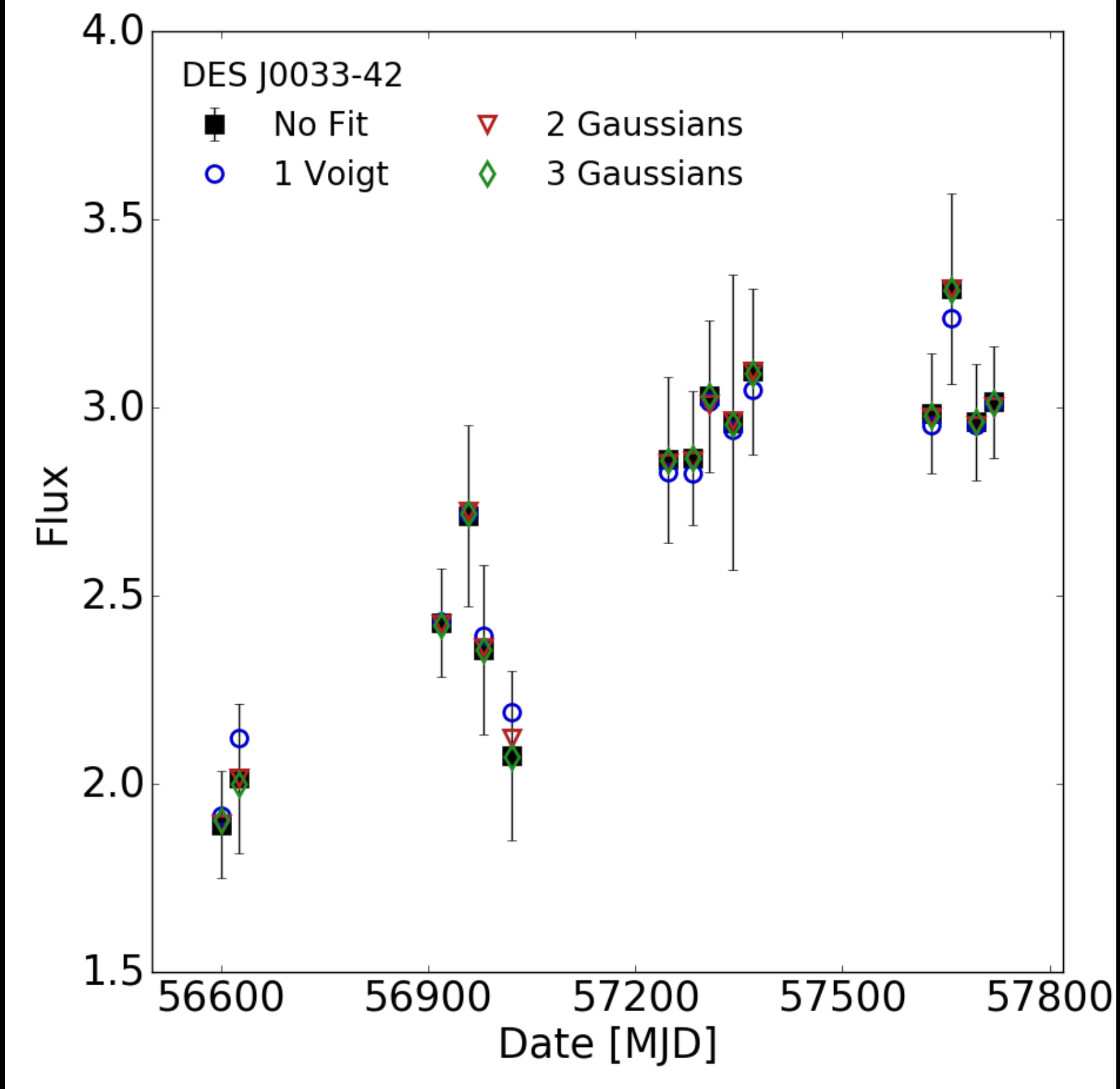
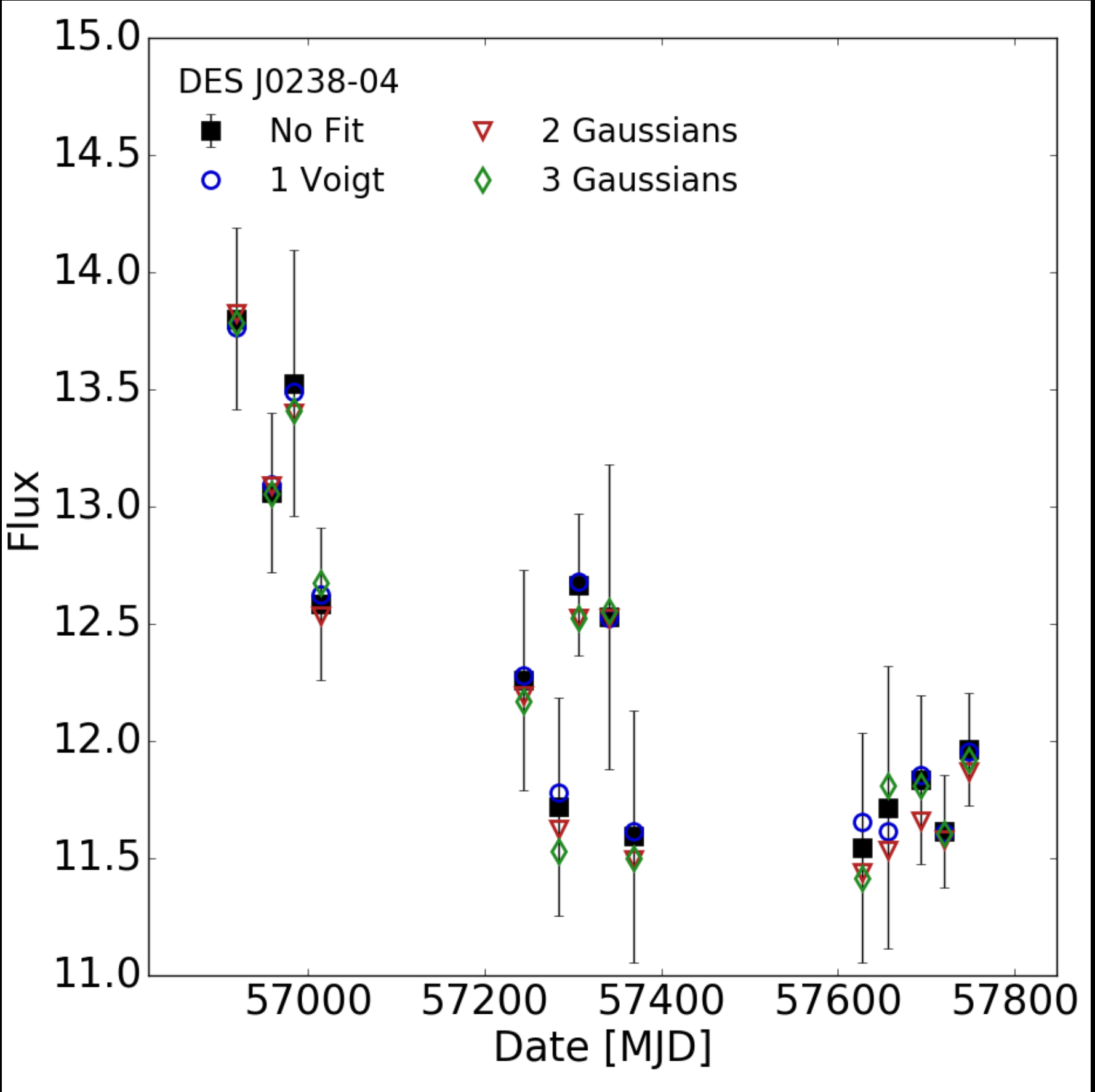


# GET LINE FLUX - DIRECT INTEGRATION





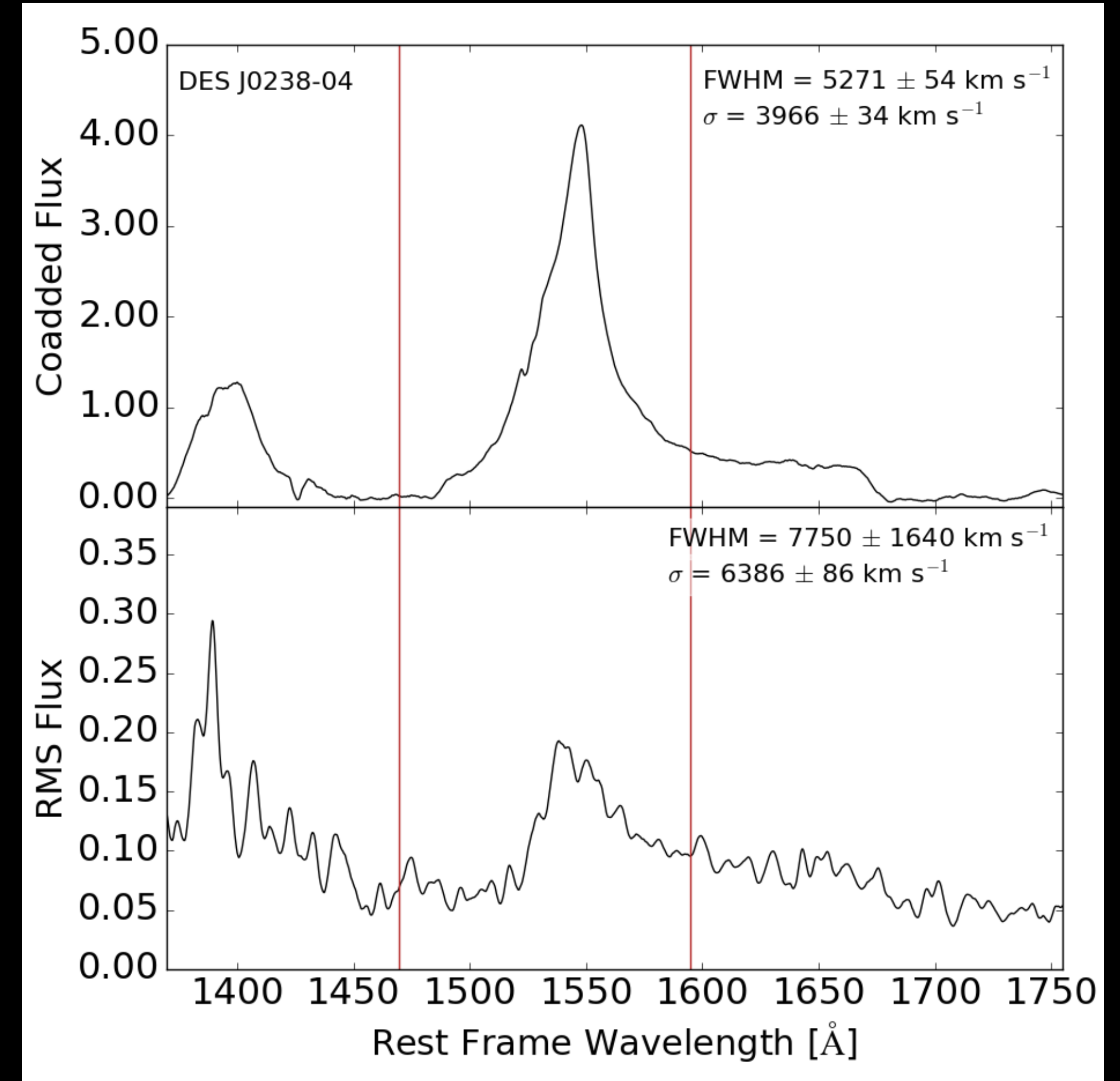
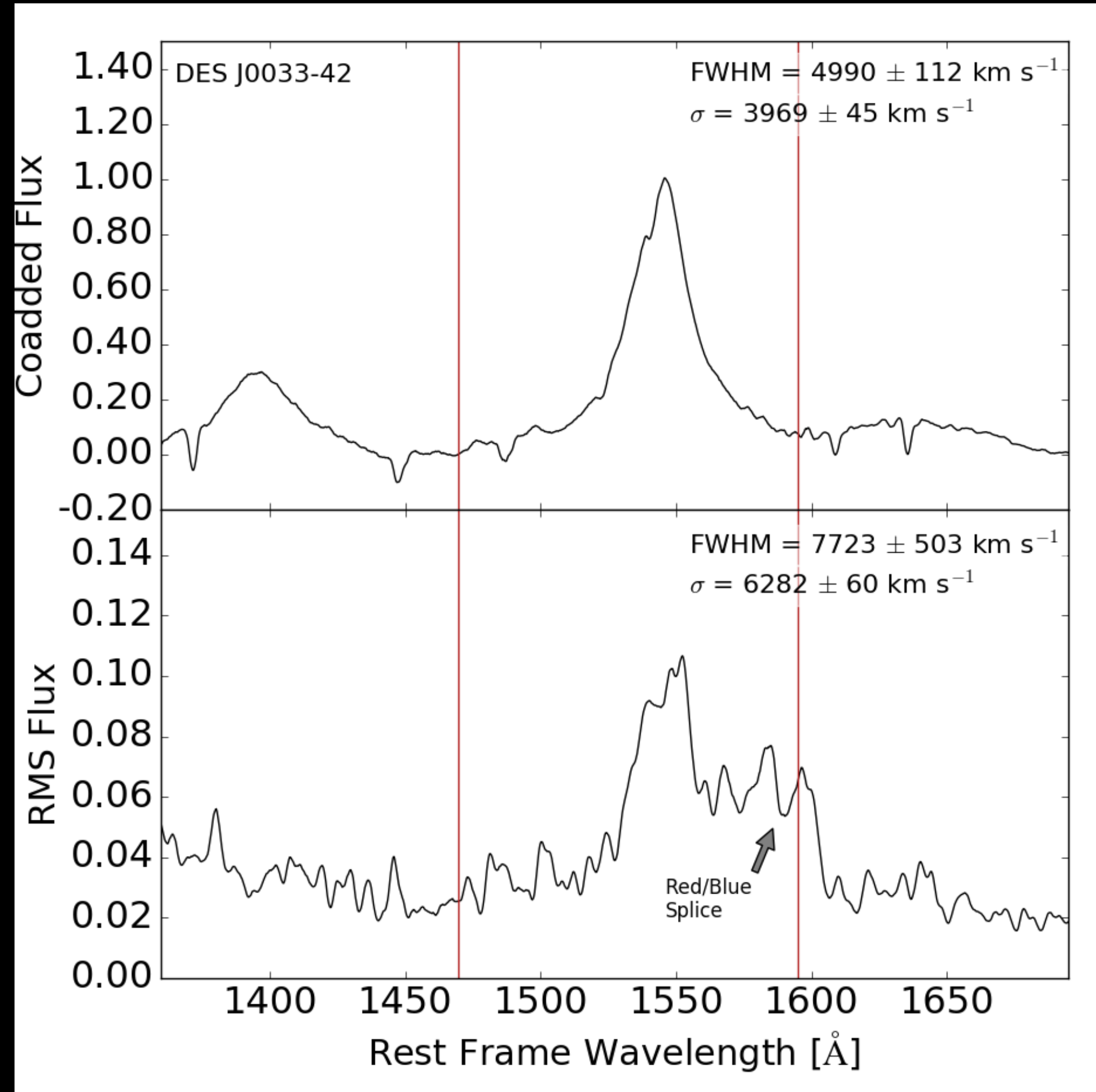
# WHAT IF YOU FIT THE LINE BEFORE INTEGRATING?



No substantial change

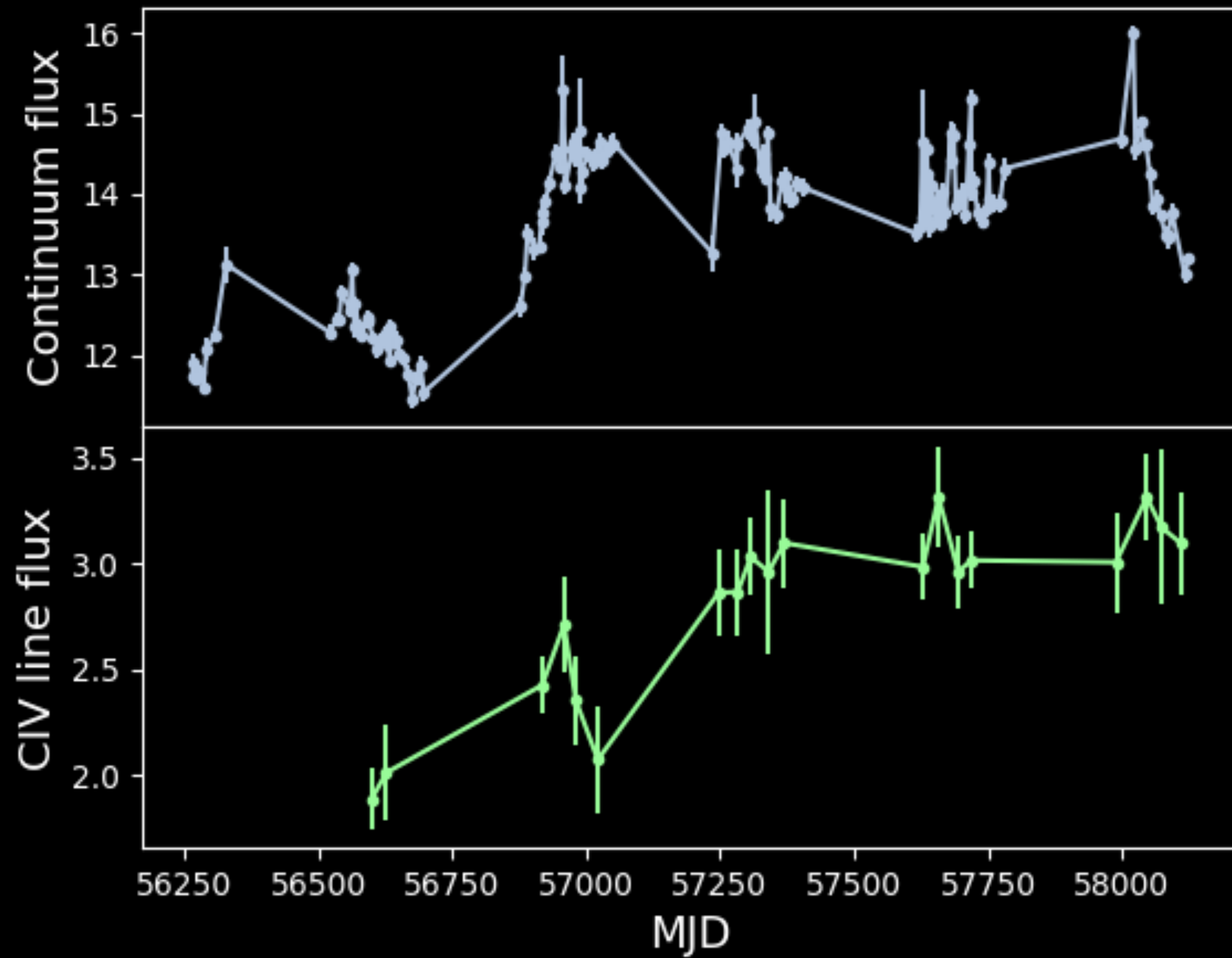


# CALCULATE EMISSION LINE WIDTH



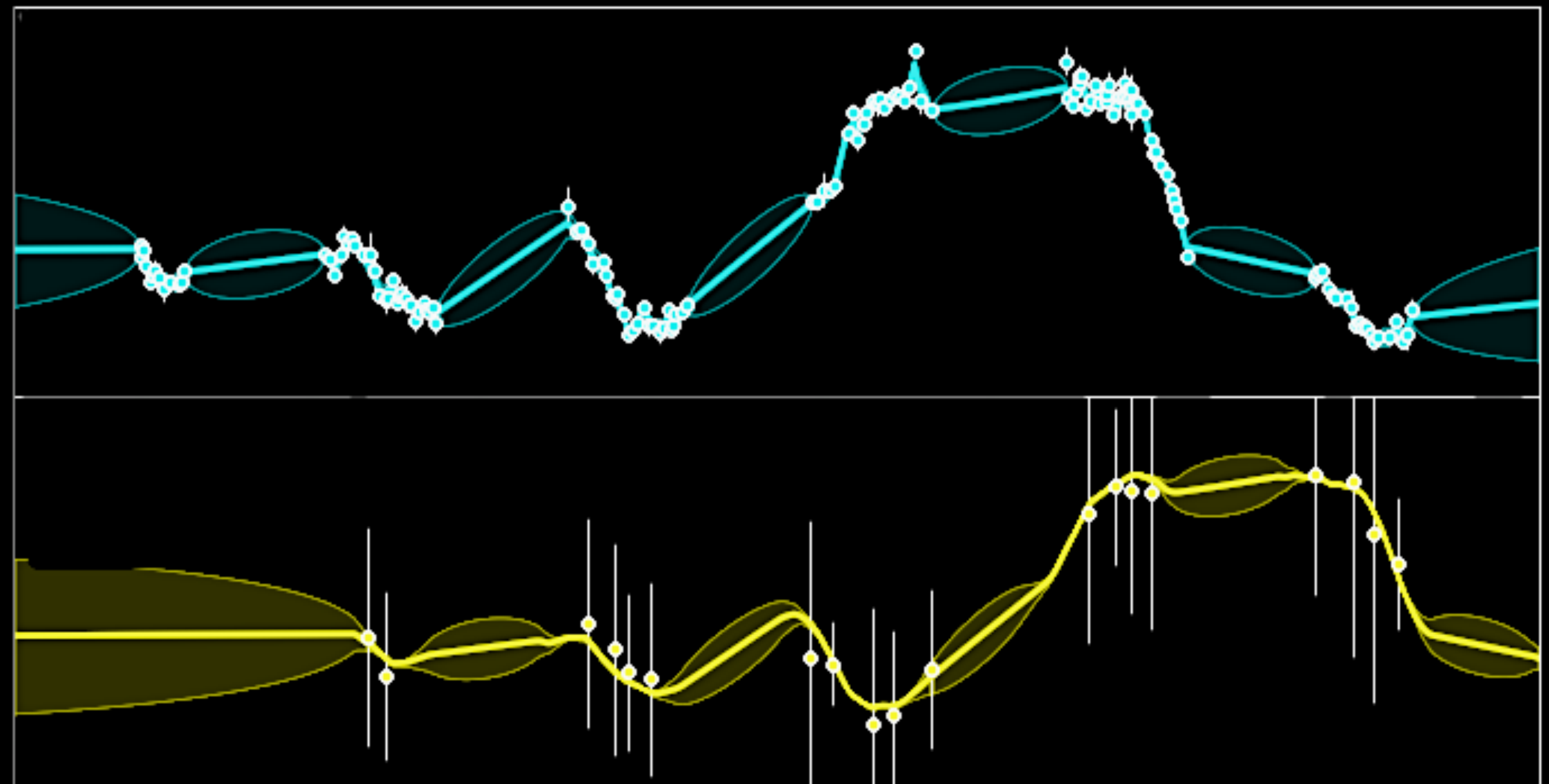


# CALCULATE THE LAGS



Interpolated  
cross-correlation

Javelin



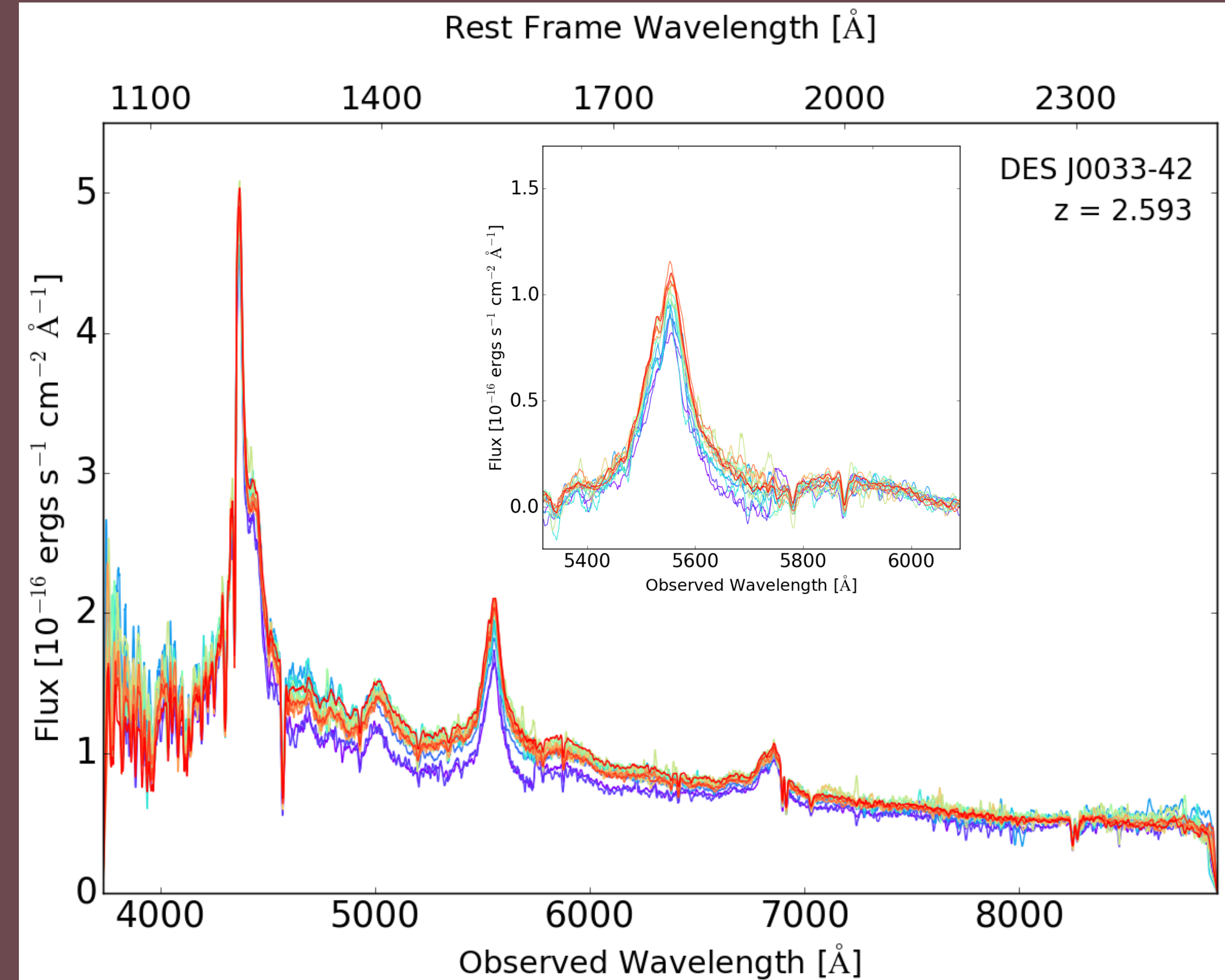
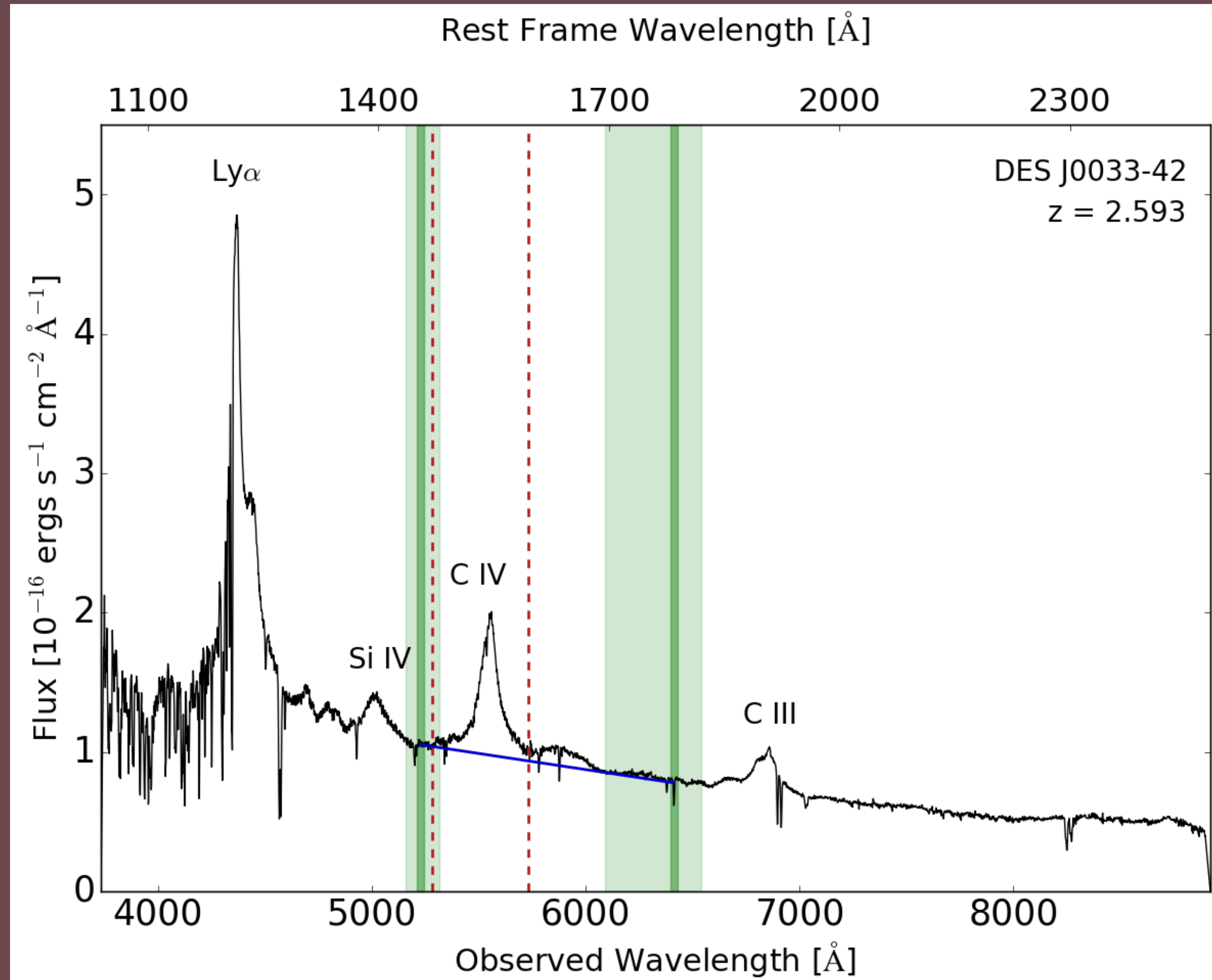


FIRST RESULTS



# DES J0033-42

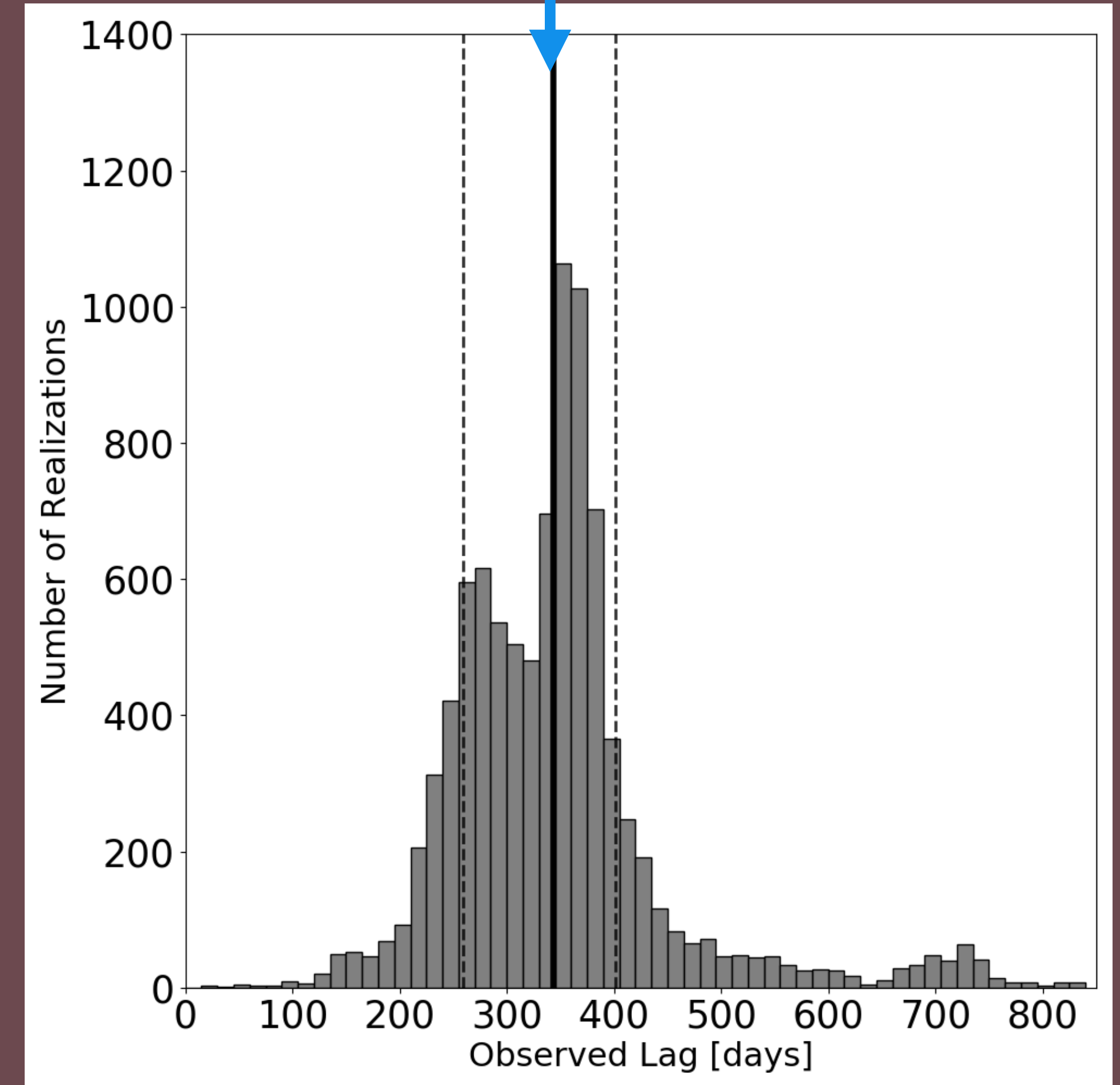
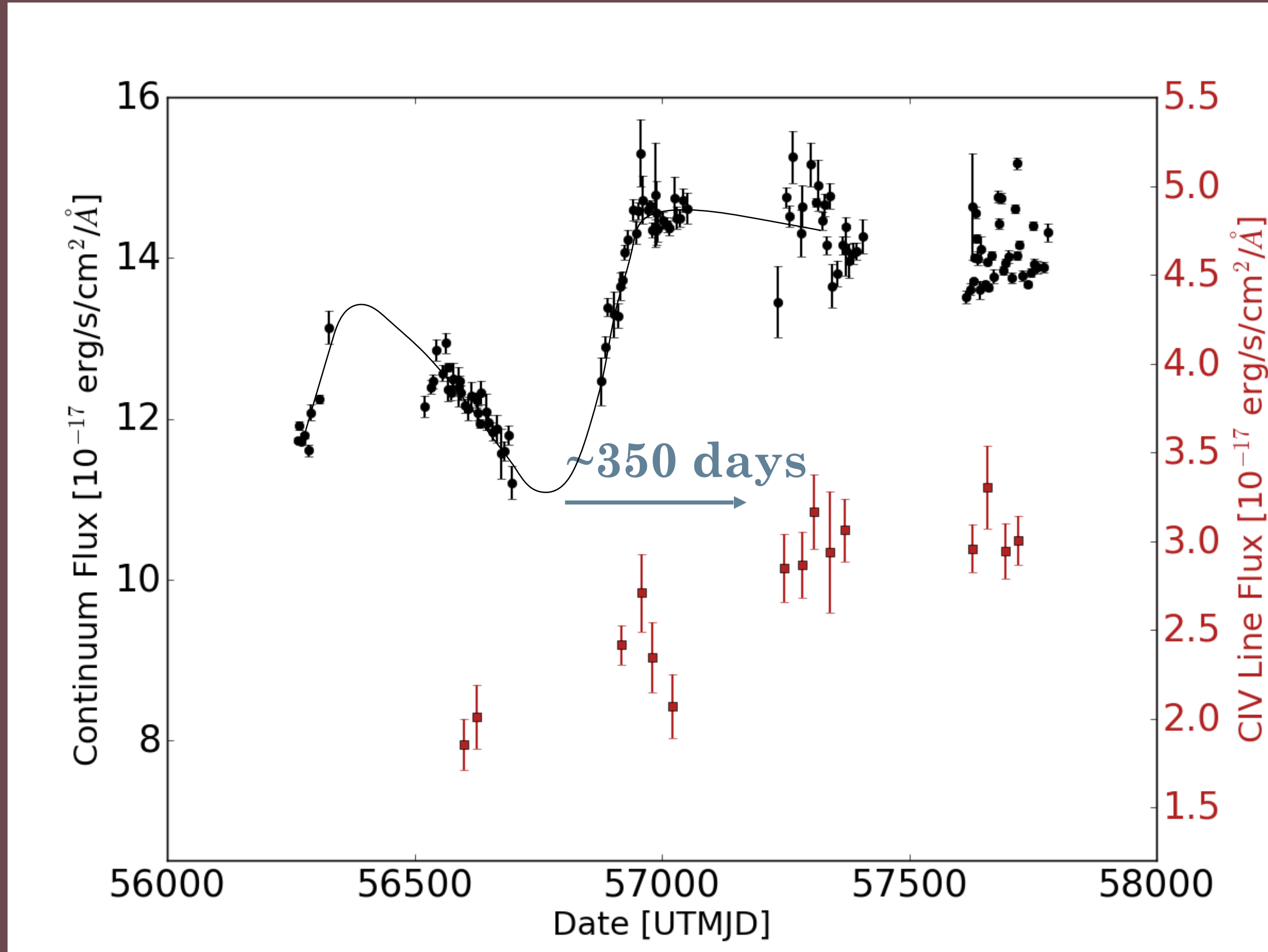
## $z=2.593$



DES J0033-42

$z=2.593$

343 days



Observed Lag =  $343^{+58}_{-84}$  days

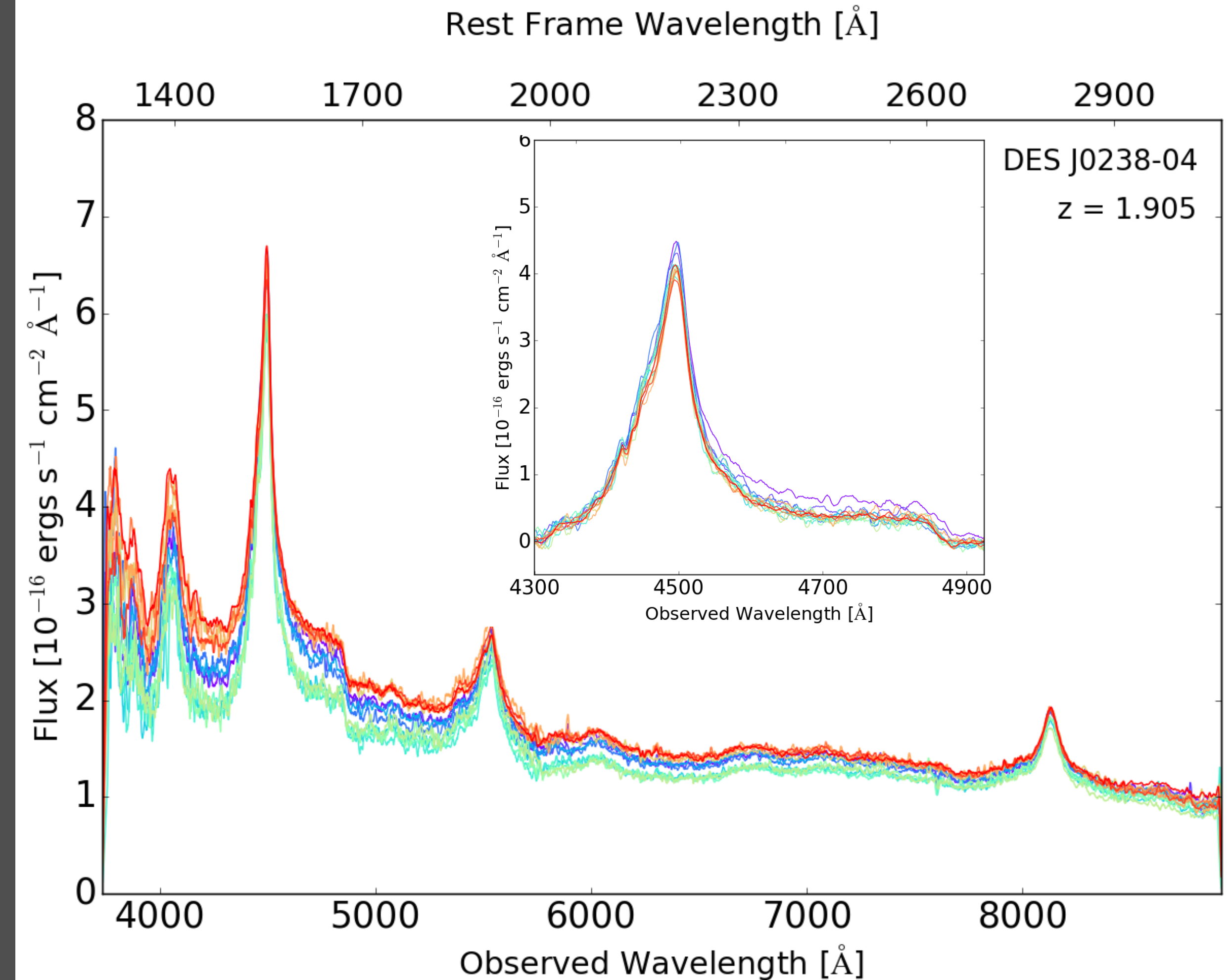
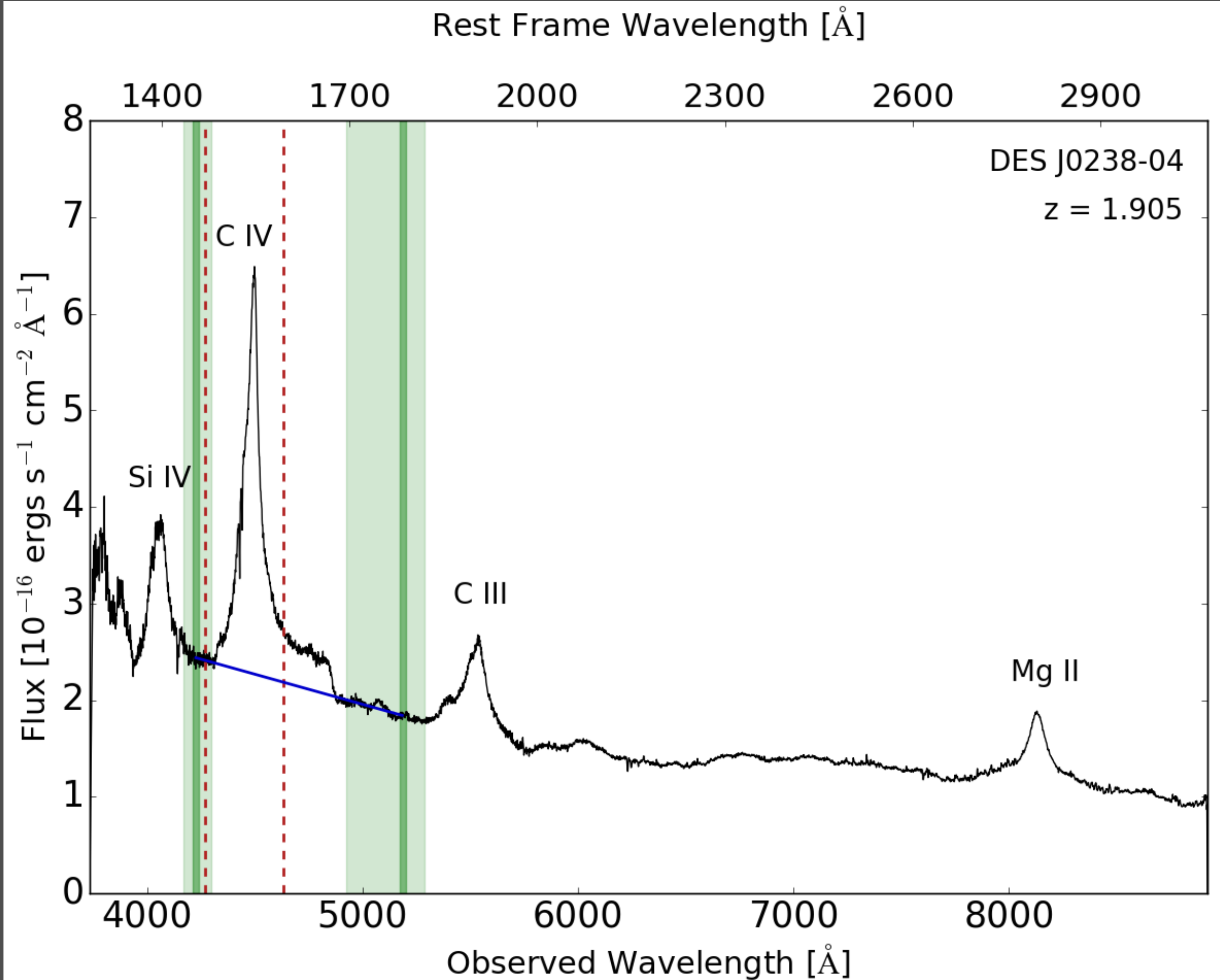
Rest frame Lag =  $95^{+16}_{-23}$  days

mass =  $3.3 \times 10^9 M_{\odot}$  (33% uncertainty)



# DES J0238-04

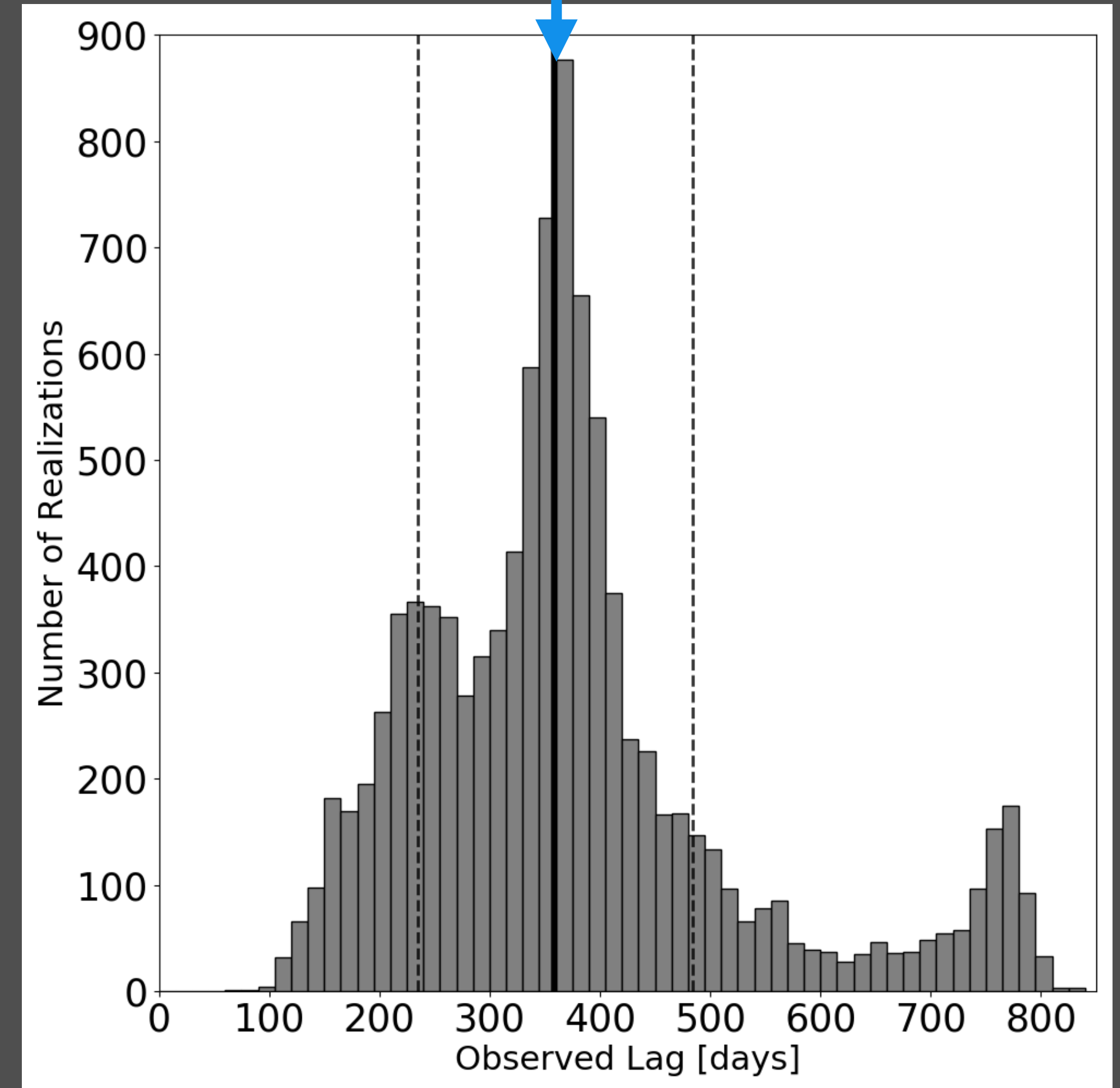
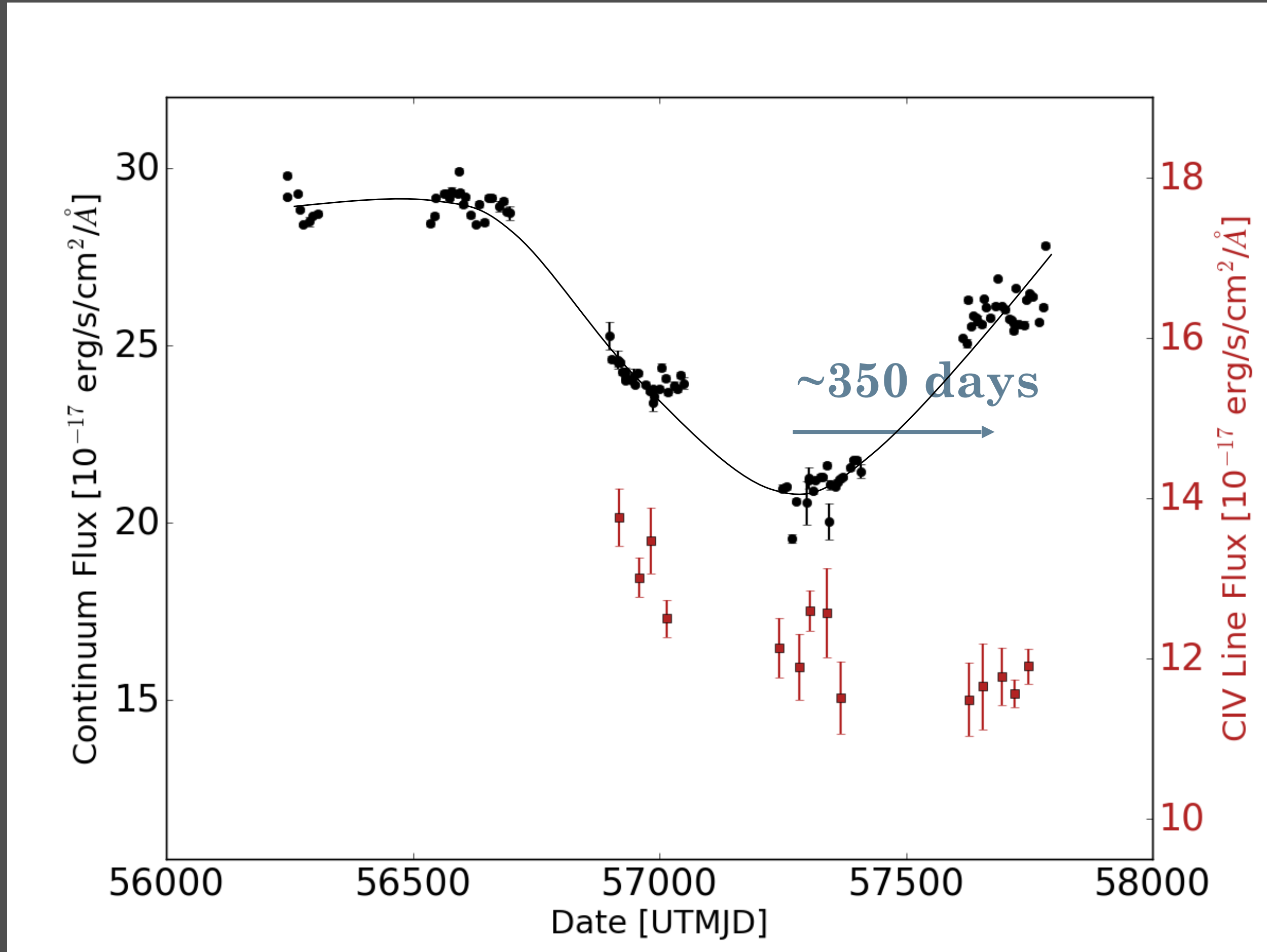
## $z=1.905$



DES J0238-04

$z=1.905$

358 days



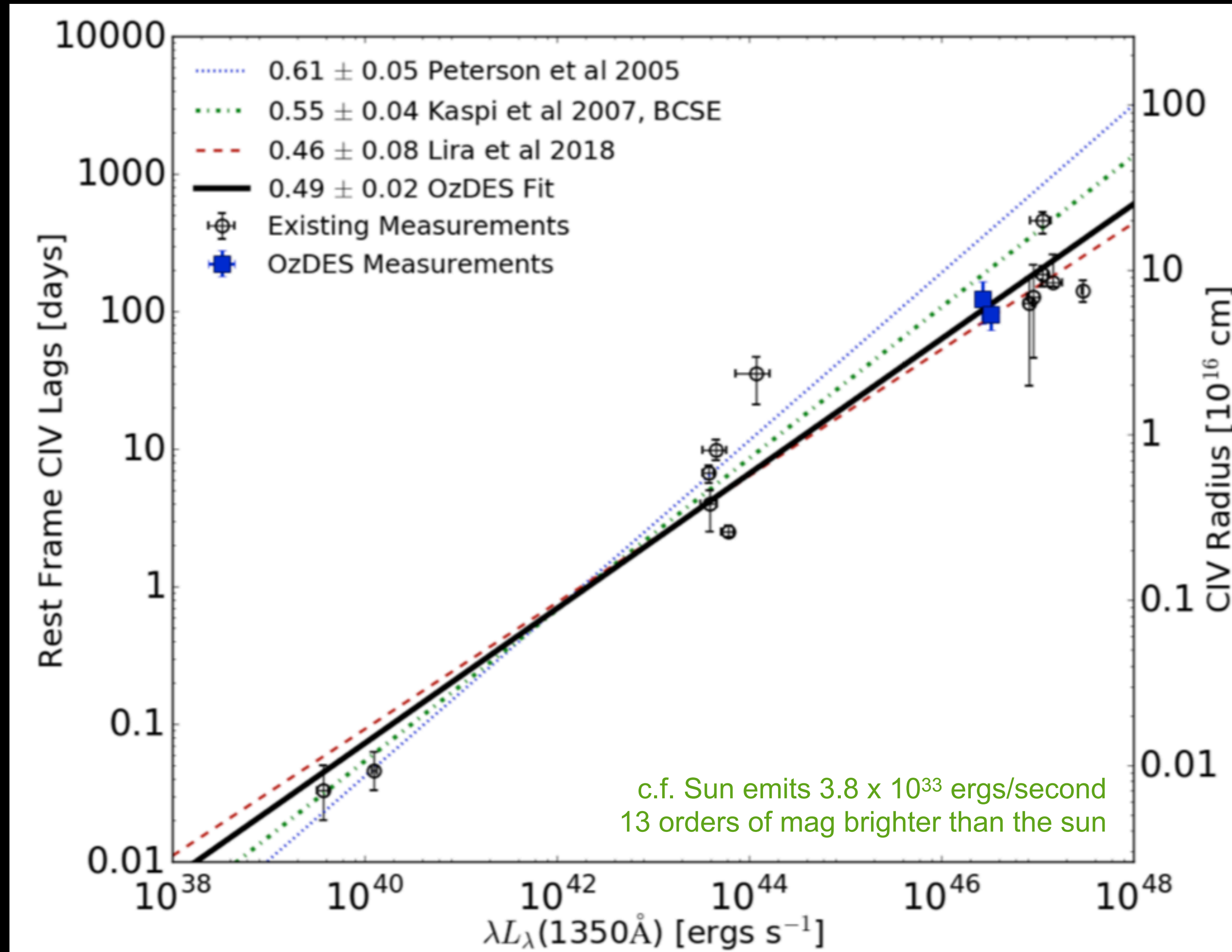
Observed Lag =  $358^{+126}_{-123}$  days

Rest frame Lag =  $123^{+43}_{-42}$  days

mass =  $4.4 \times 10^9 M_{\odot}$  (44% uncertainty)



# FIRST RESULTS - RADIUS LUMINOSITY

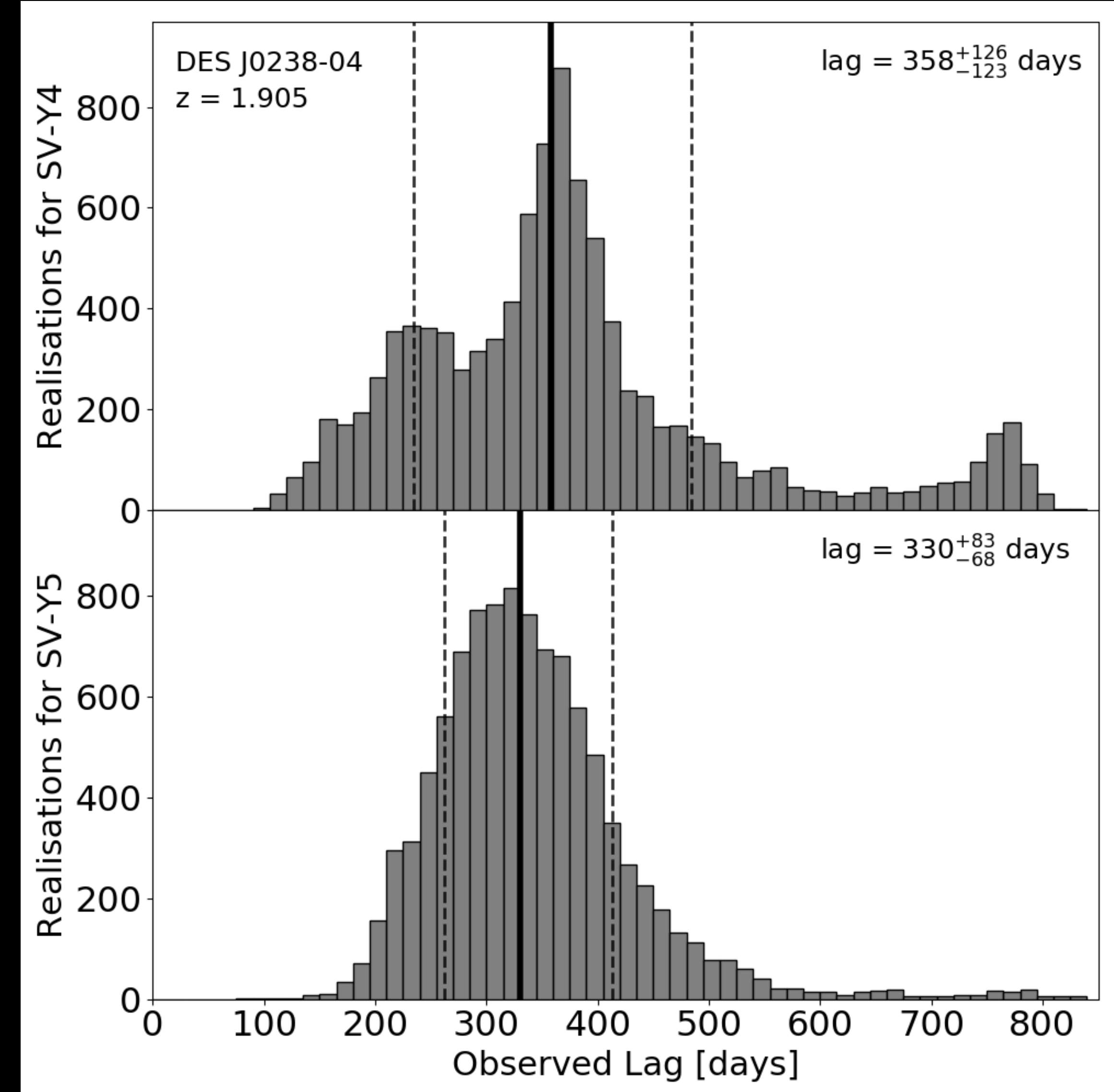
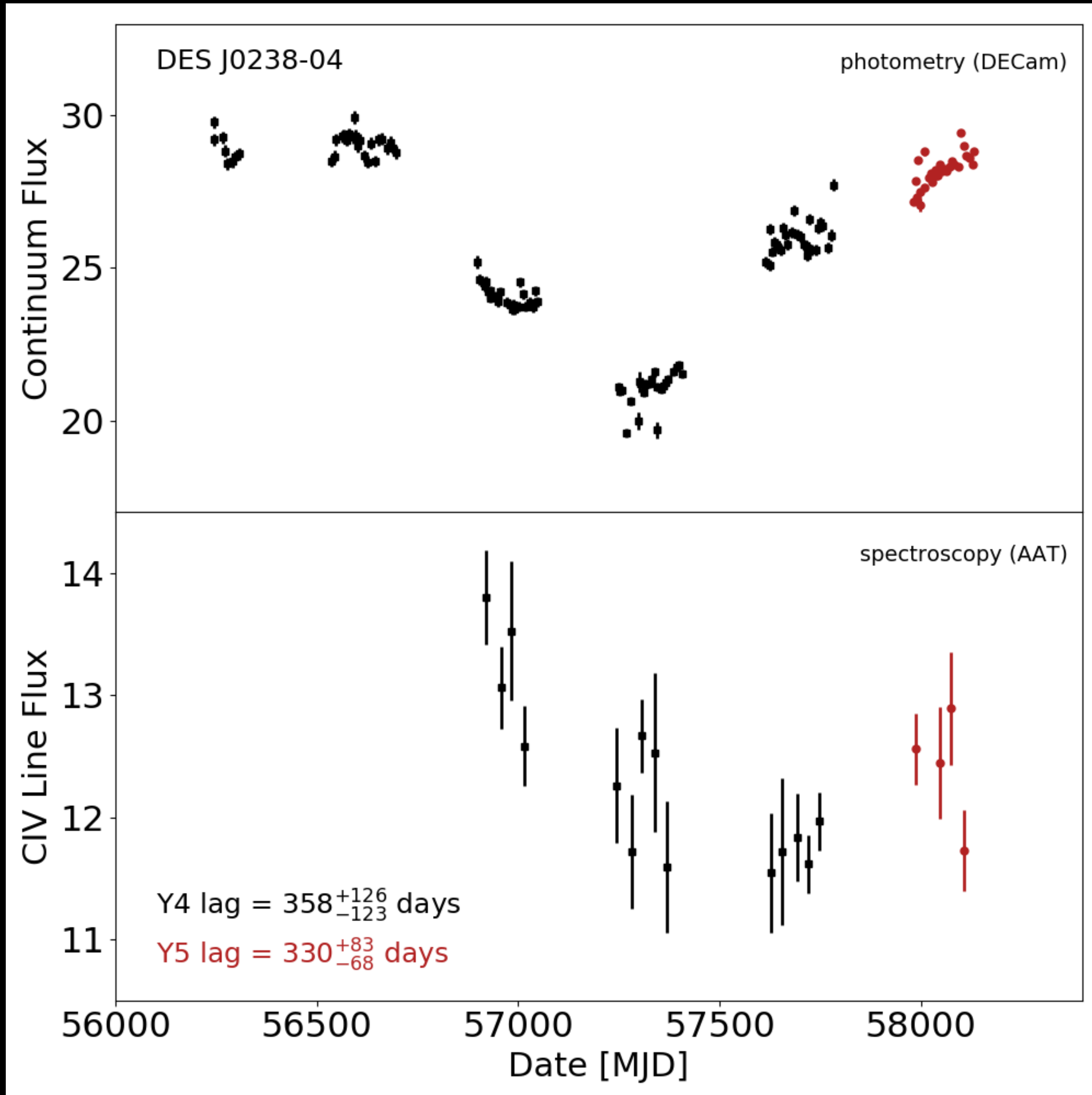


$z=2.593, 3.3 \times 10^9 M_{\odot}$   
(33% uncertainty)

$z=1.905, 4.4 \times 10^9 M_{\odot}$   
(44% uncertainty)

Just used 4 most robust measurements  
from Lira et al. 2018

# LOOK WHAT ONE MORE SEASON CAN DO!



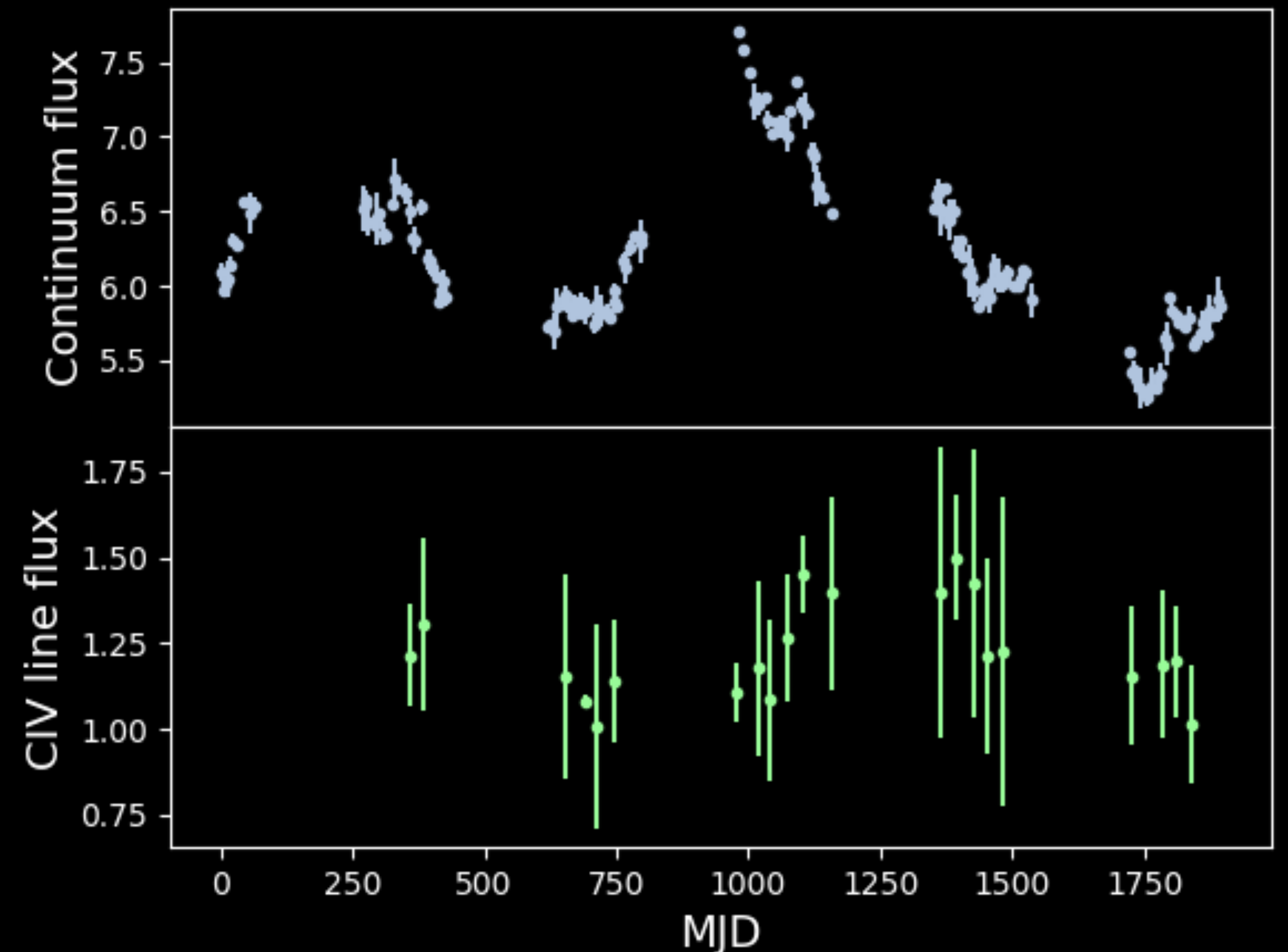


# IMPROVING THE ANALYSIS

# HOW DO WE KNOW WE ARE DERIVING THE CORRECT LAGS, WITH REALISTIC UNCERTAINTIES?

## Simulations!!

- Based on the **Damped Random Walk** model of AGN variability
- Parametrised by the **variability timescale** and the **amplitude of variability**
- **Realistically** models **uncertainties** and scatter expected in observations
- Takes as **input** physical characteristics of real sources including **redshift, luminosity, uncertainties**, and observational **cadence**

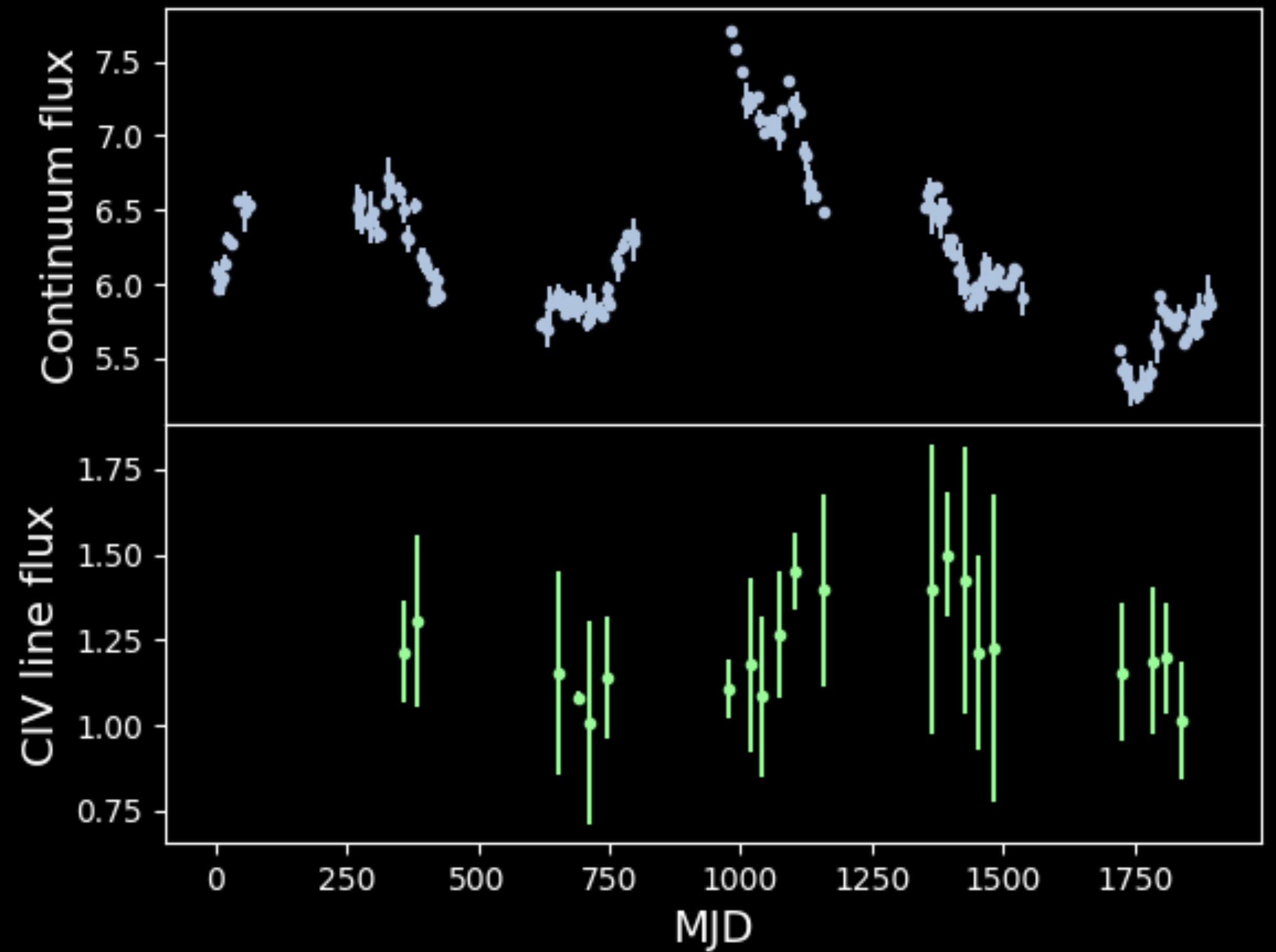
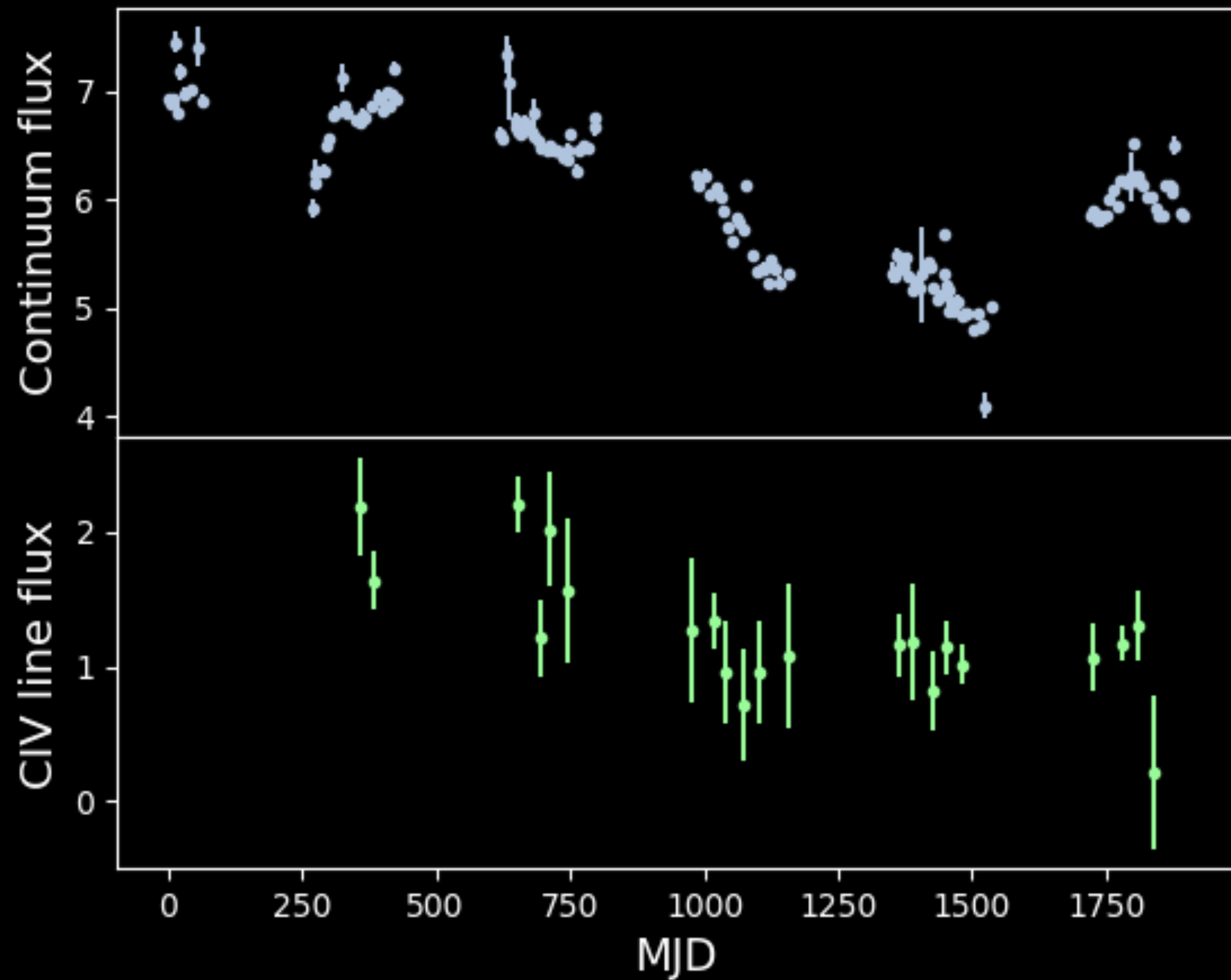


See Umang Malik's talk on Monday

Figure: Andrew Penton

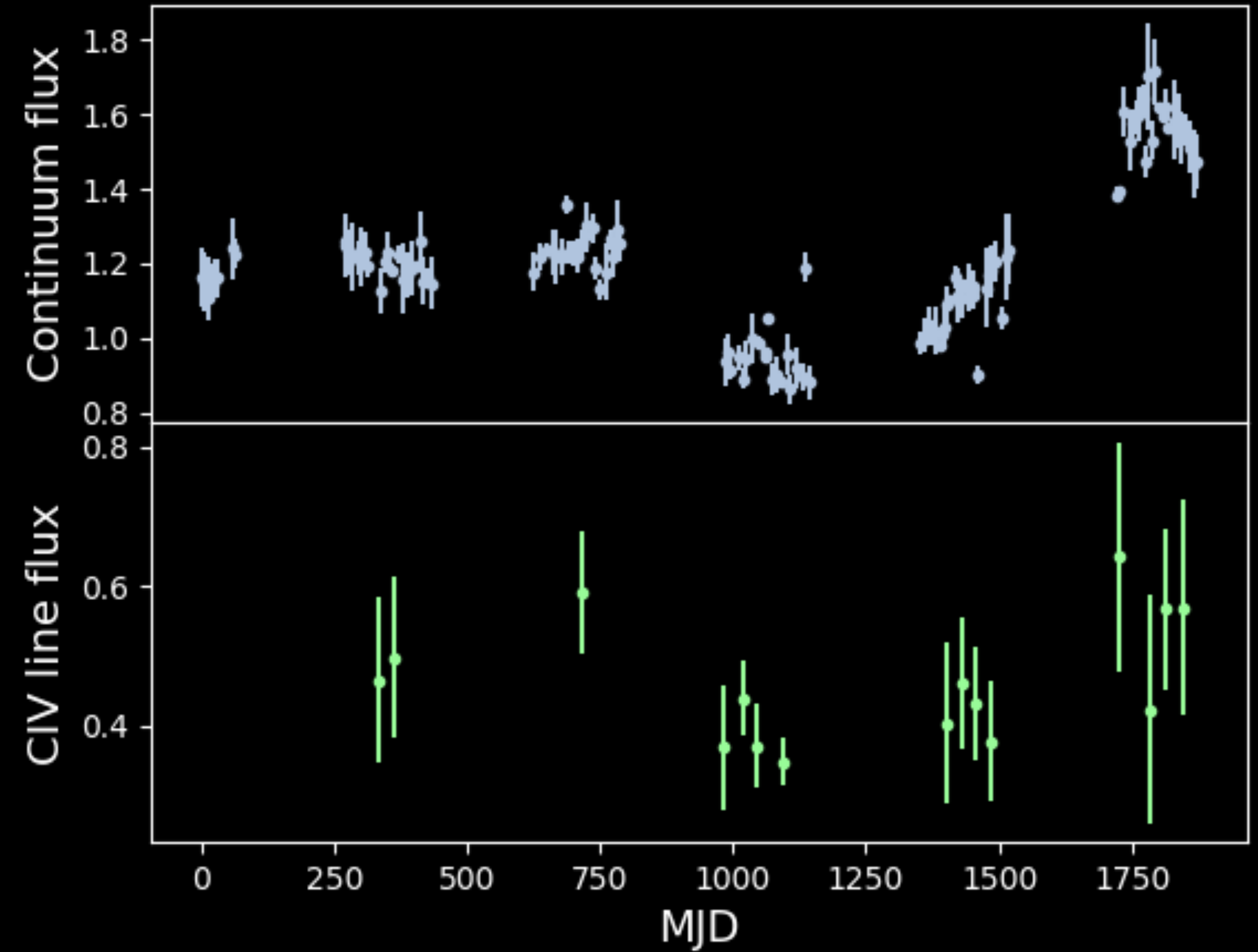
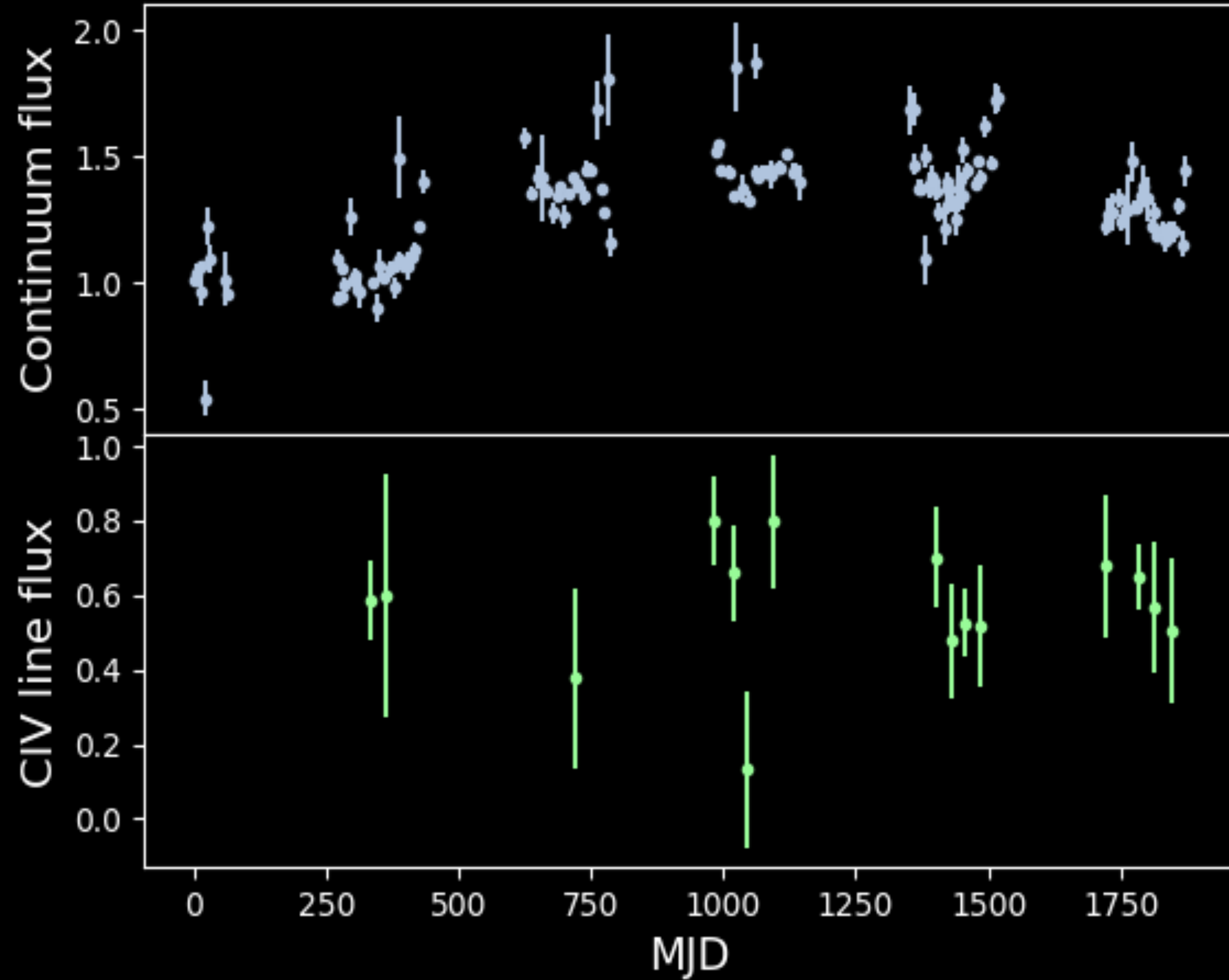


# COMPARISON TO OBSERVED DATA



Which is which?

# COMPARISON TO OBSERVED DATA

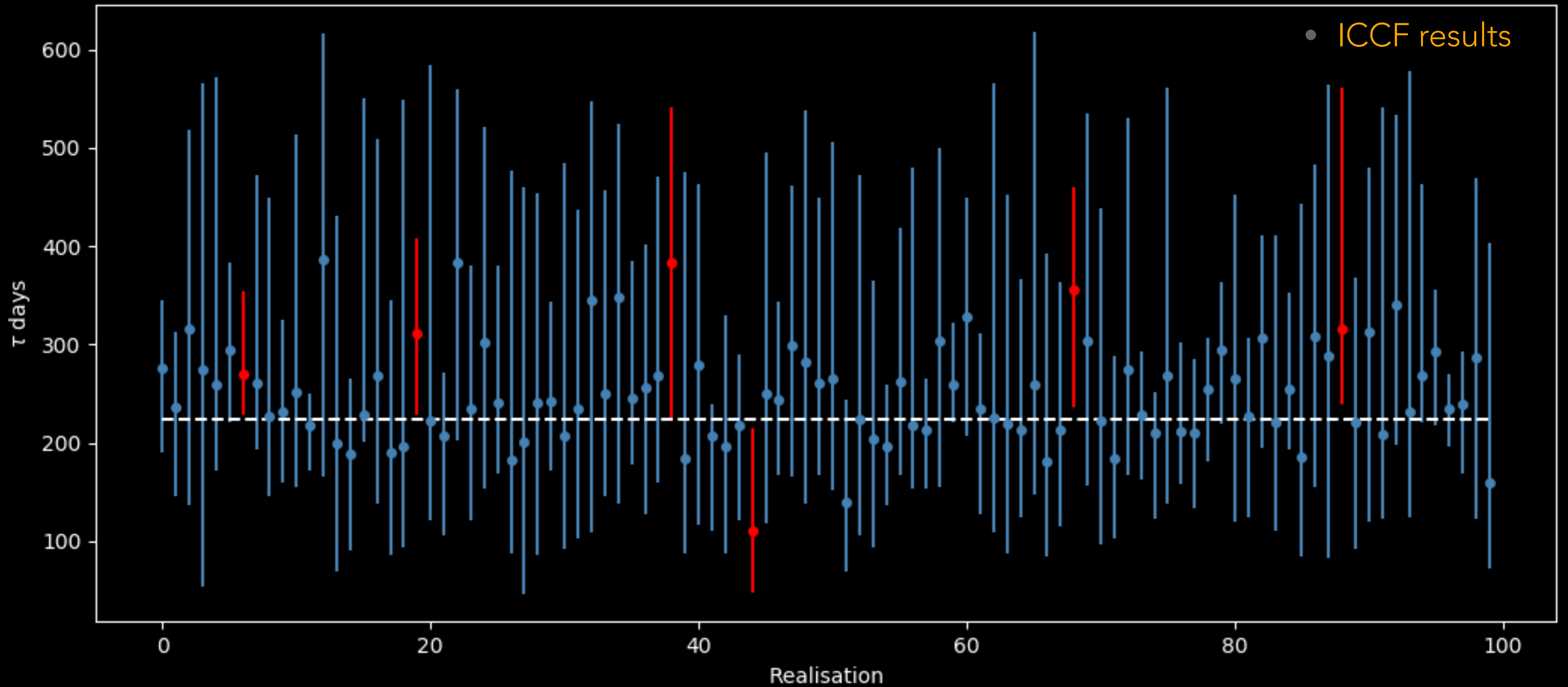


Which is which?



WHAT CAN WE DO WITH  
THESE?

# STATISTICS!!

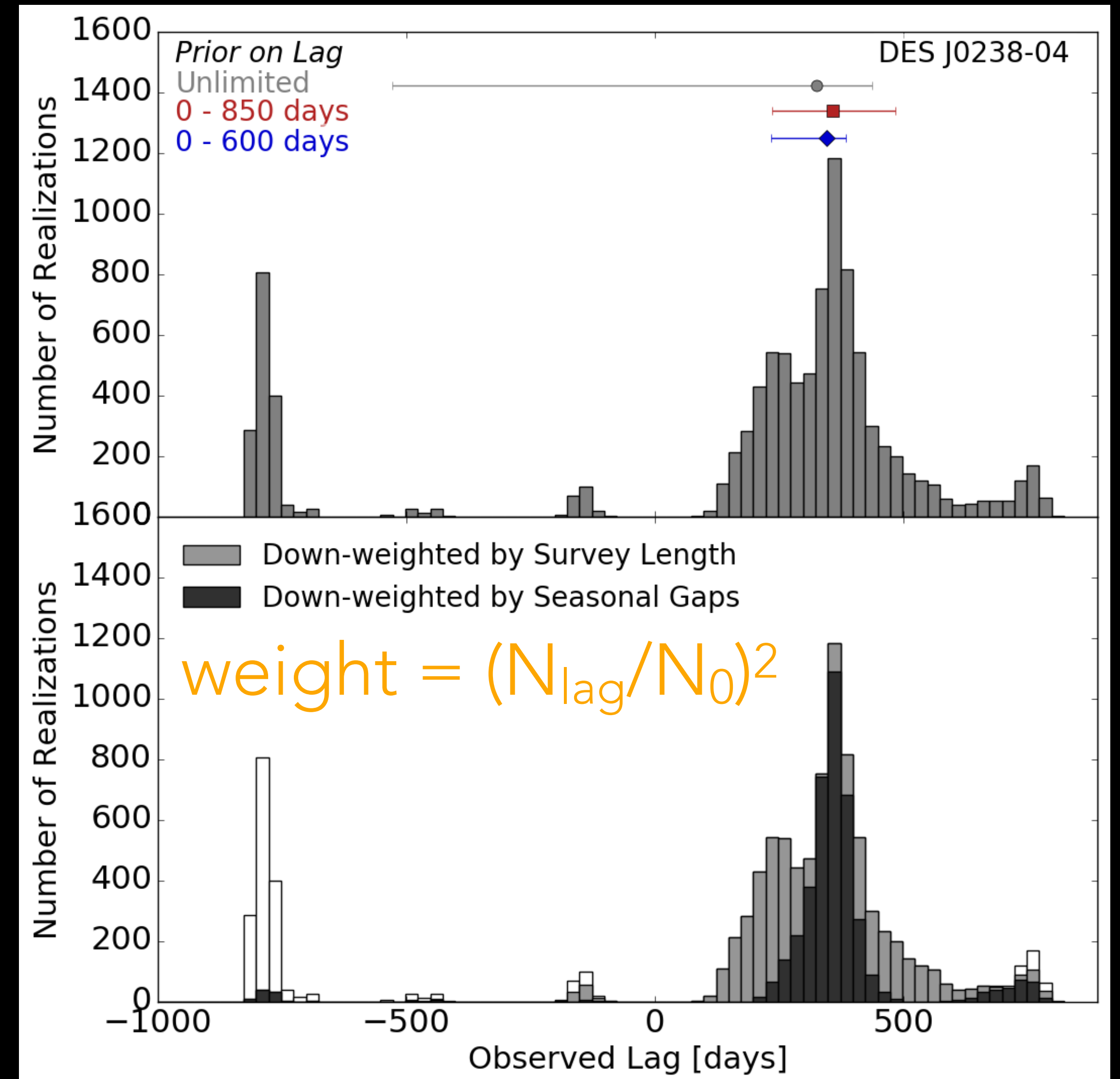
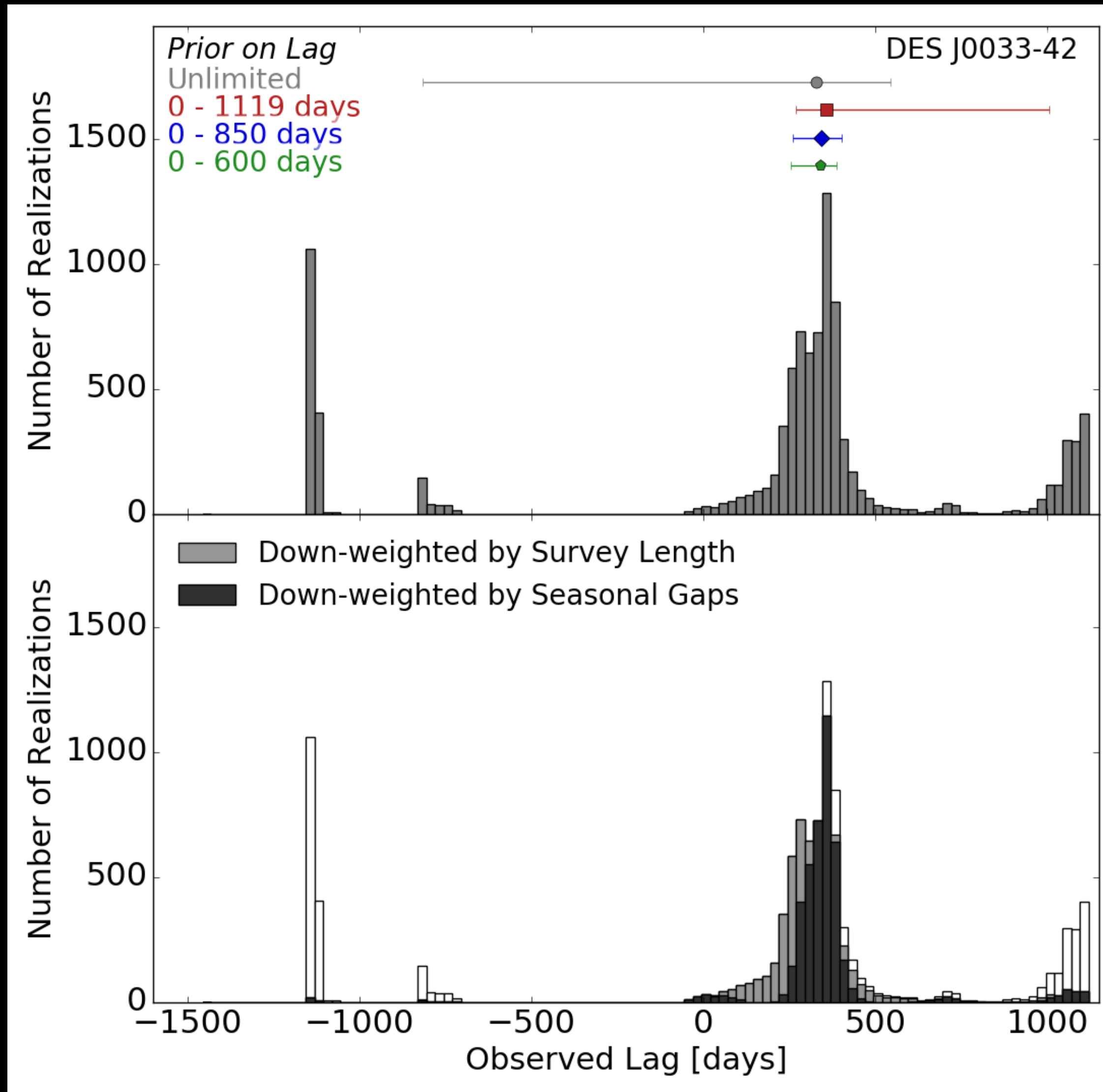


- Only 8% disagree @ 1 sigma
- None disagree @ 2 sigma

Uncertainties are systematically too large.

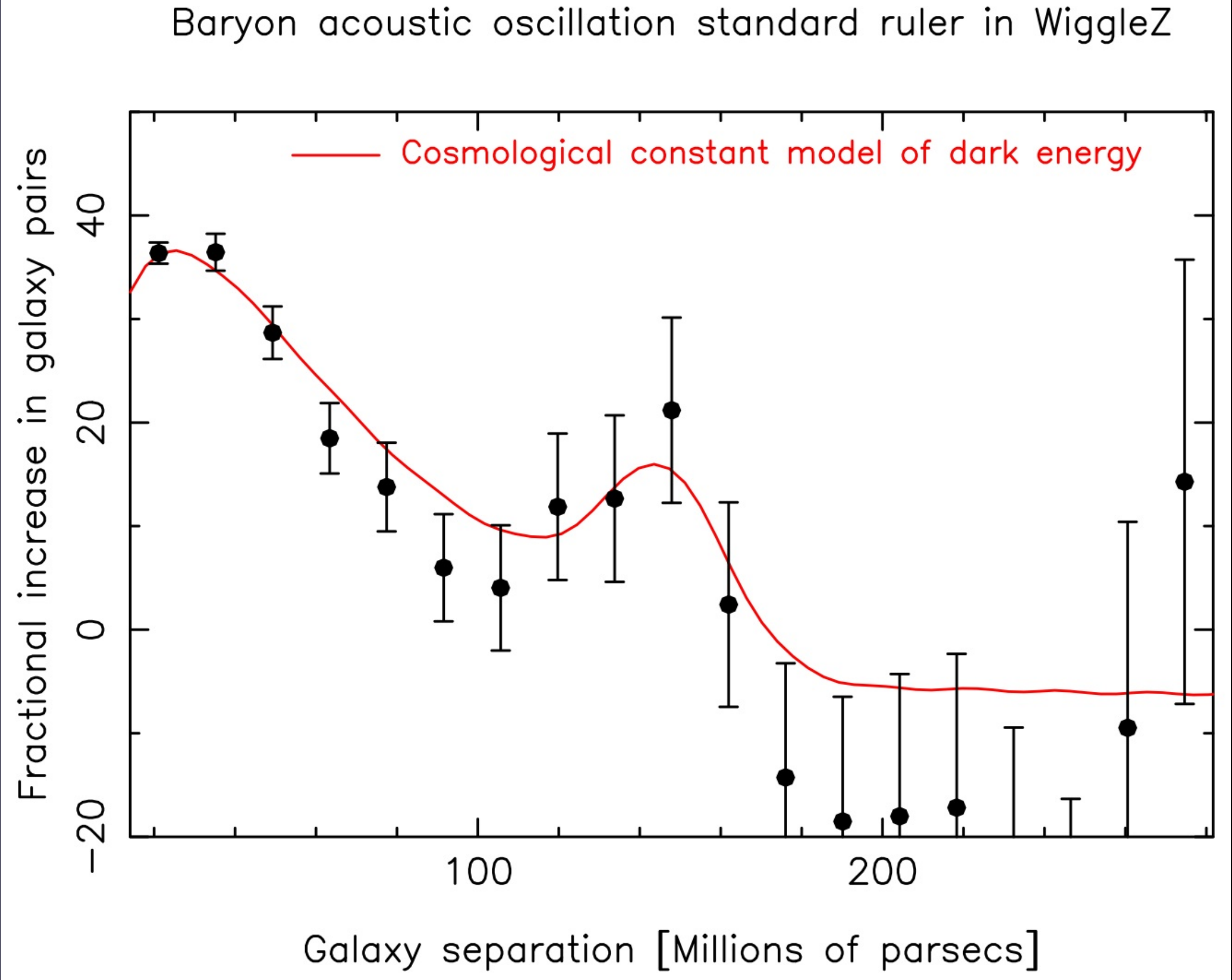
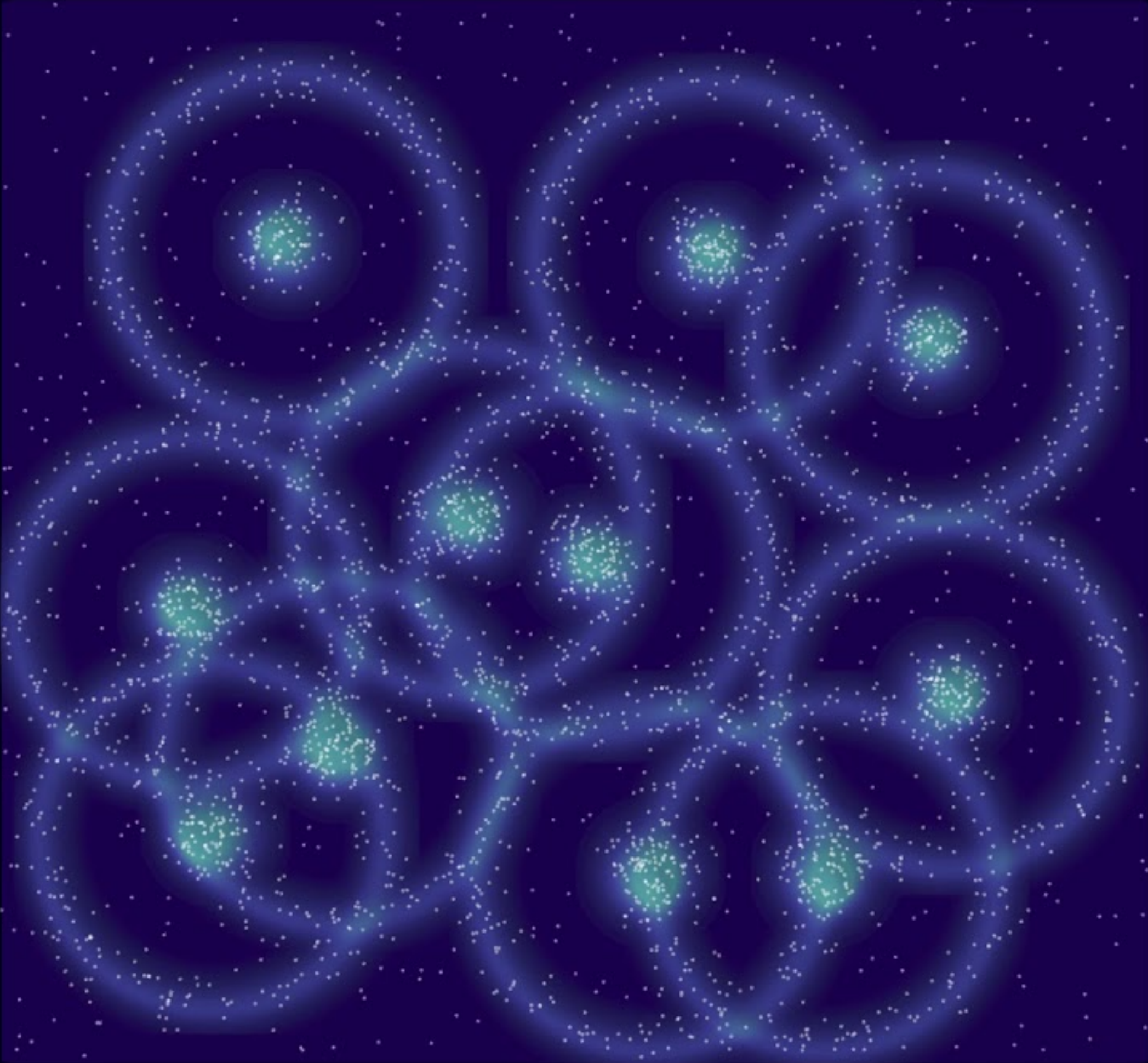


# HOW IMPORTANT IS THE LAG PRIOR? AND CAN WE DOWN-WEIGHT FOR OVERLAP?





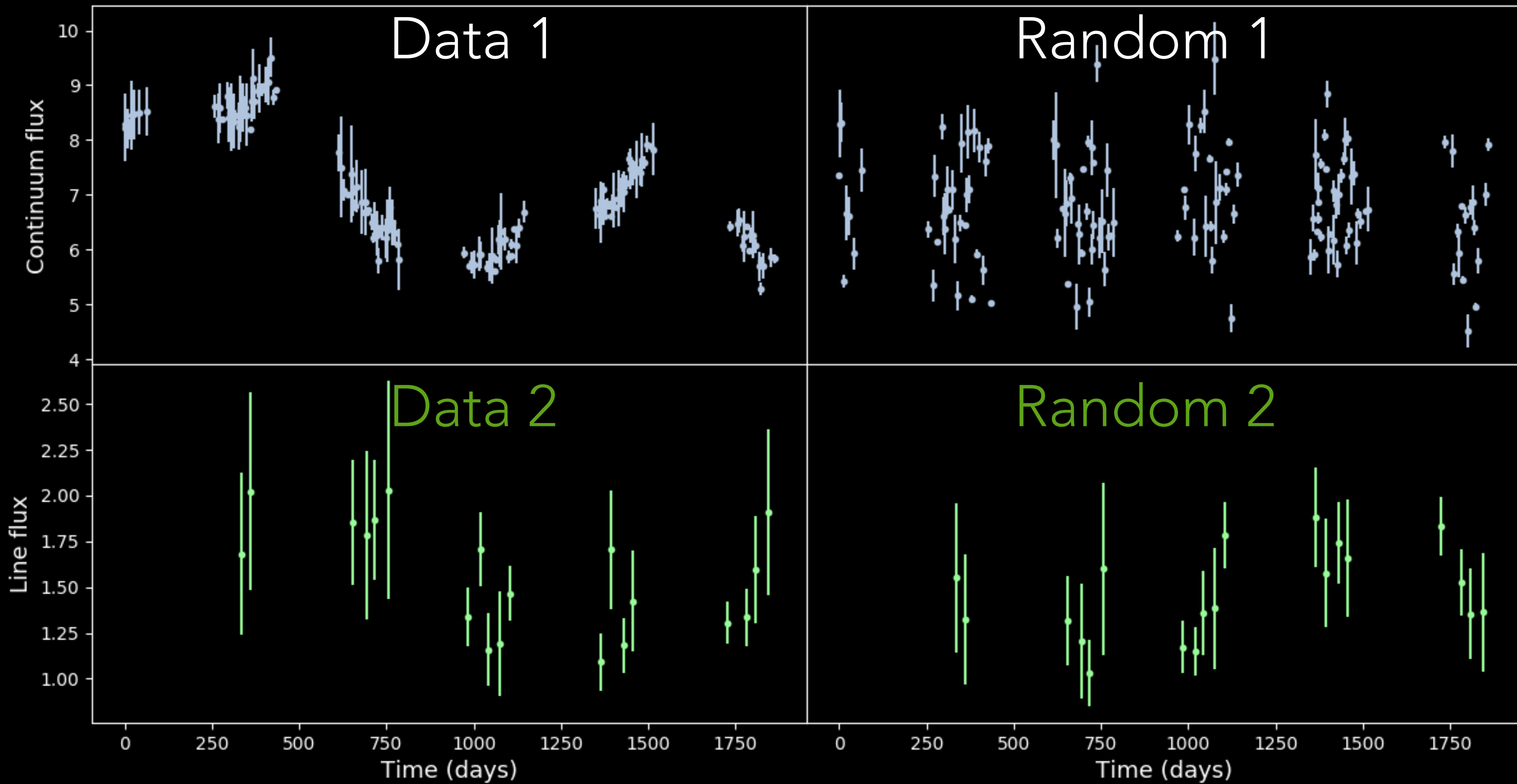
# STANDARD TECHNIQUES IN BARYON ACOUSTIC OSCILLATION COSMOLOGY



Use standard BAO Window Function techniques to take into account missing data.

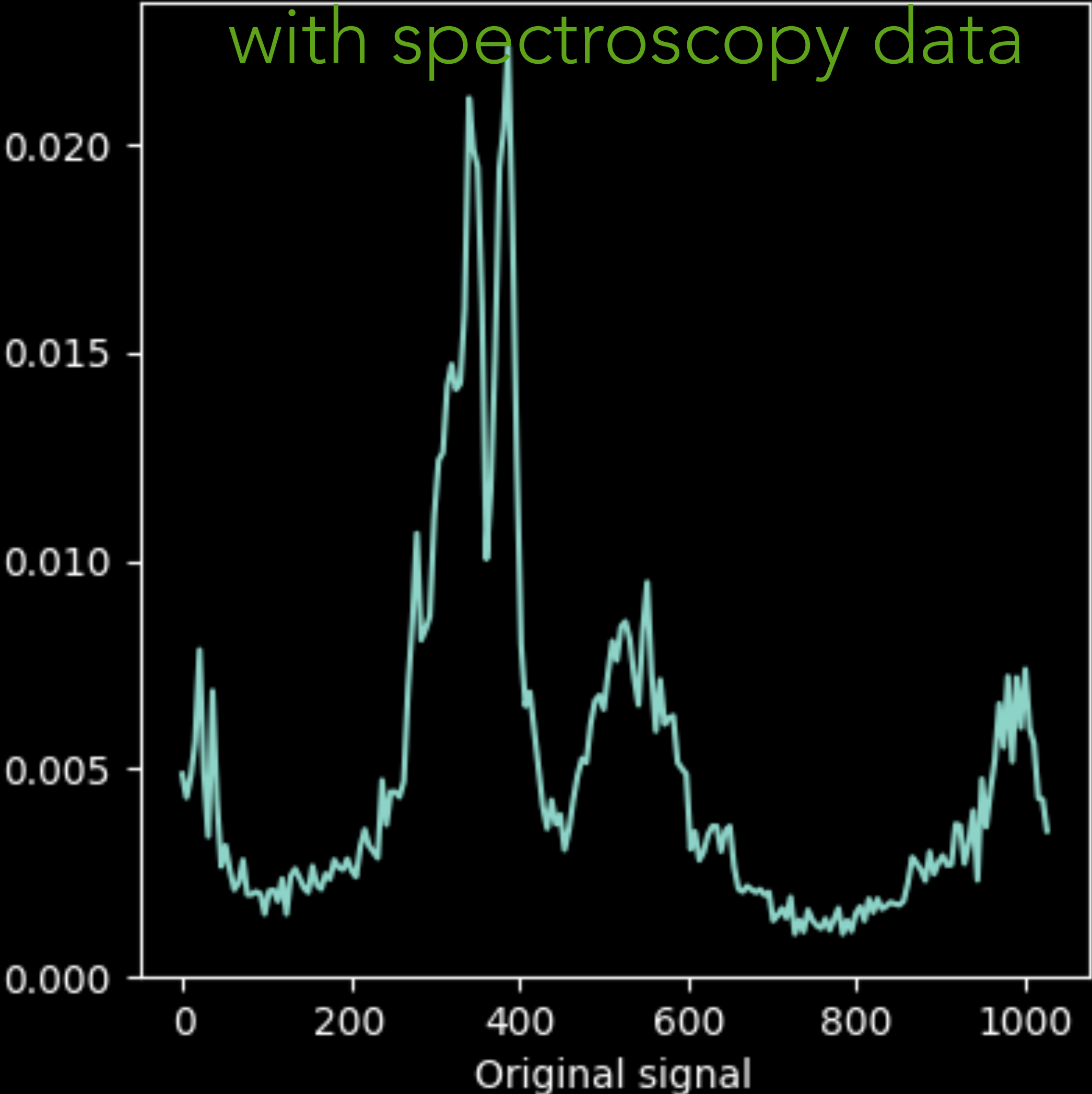


# WHAT DOES THIS LOOK LIKE?

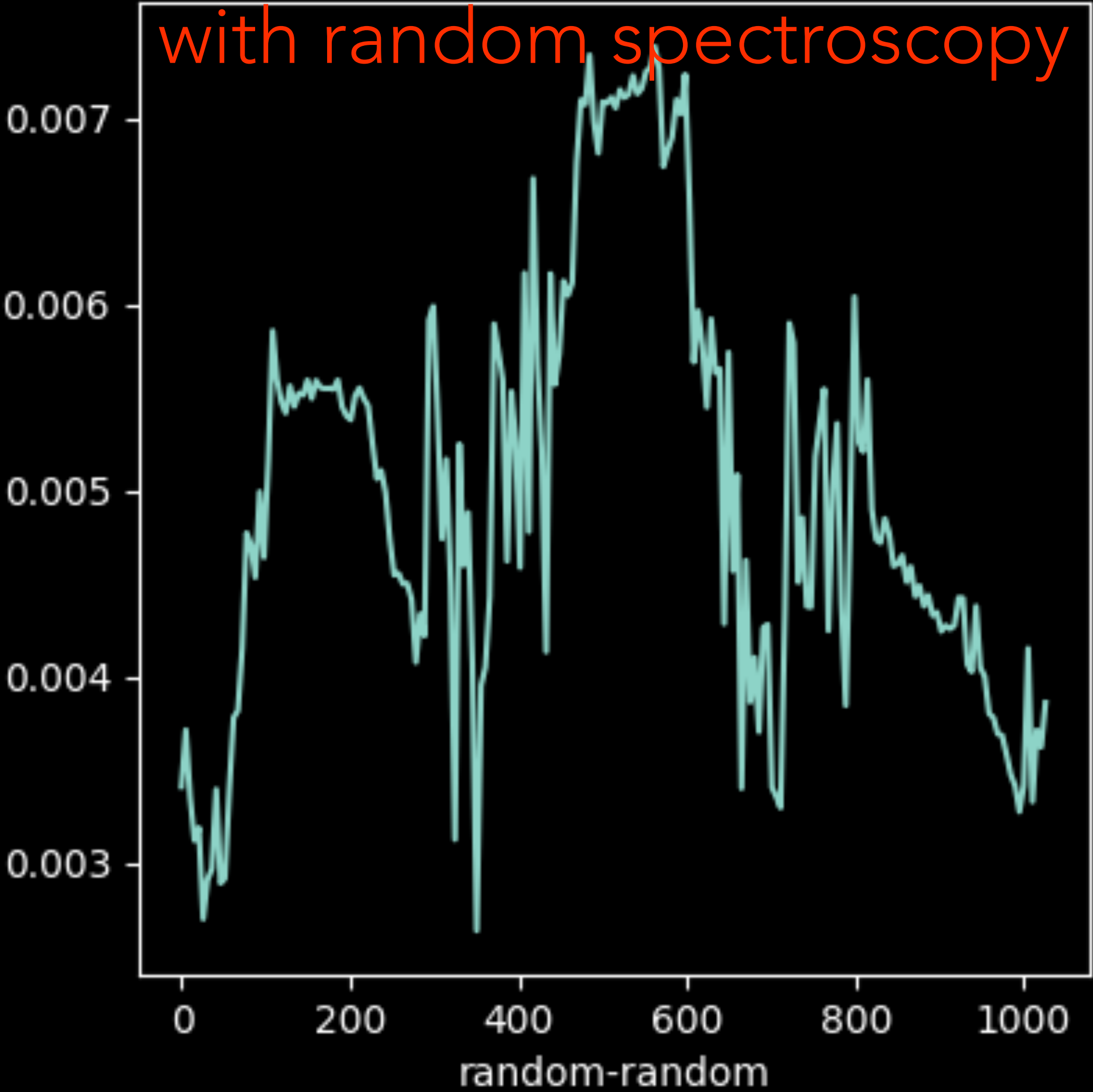


# WHAT DOES THIS LOOK LIKE?

Photometry data crossed  
with spectroscopy data



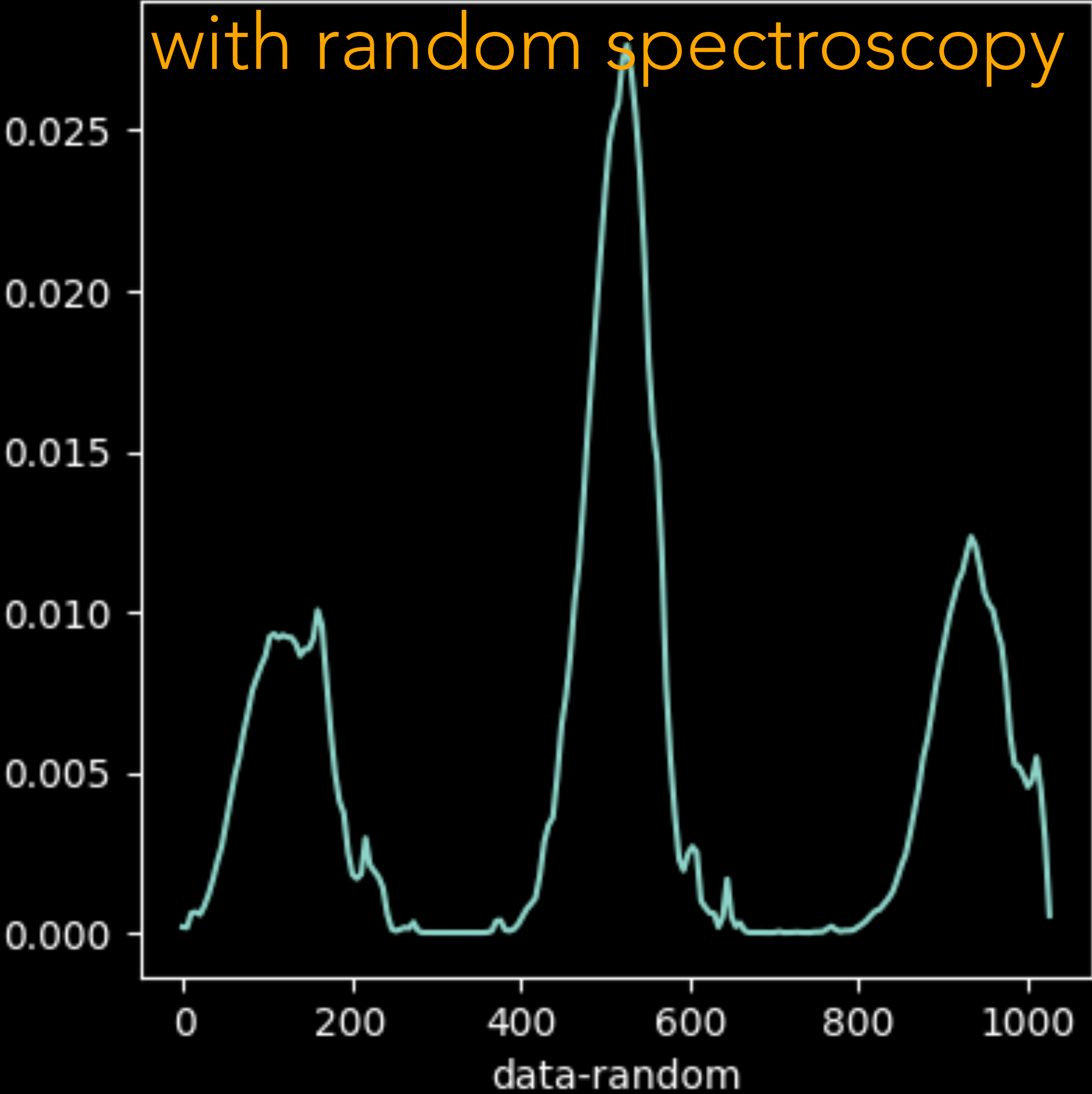
Random photometry crossed  
with random spectroscopy



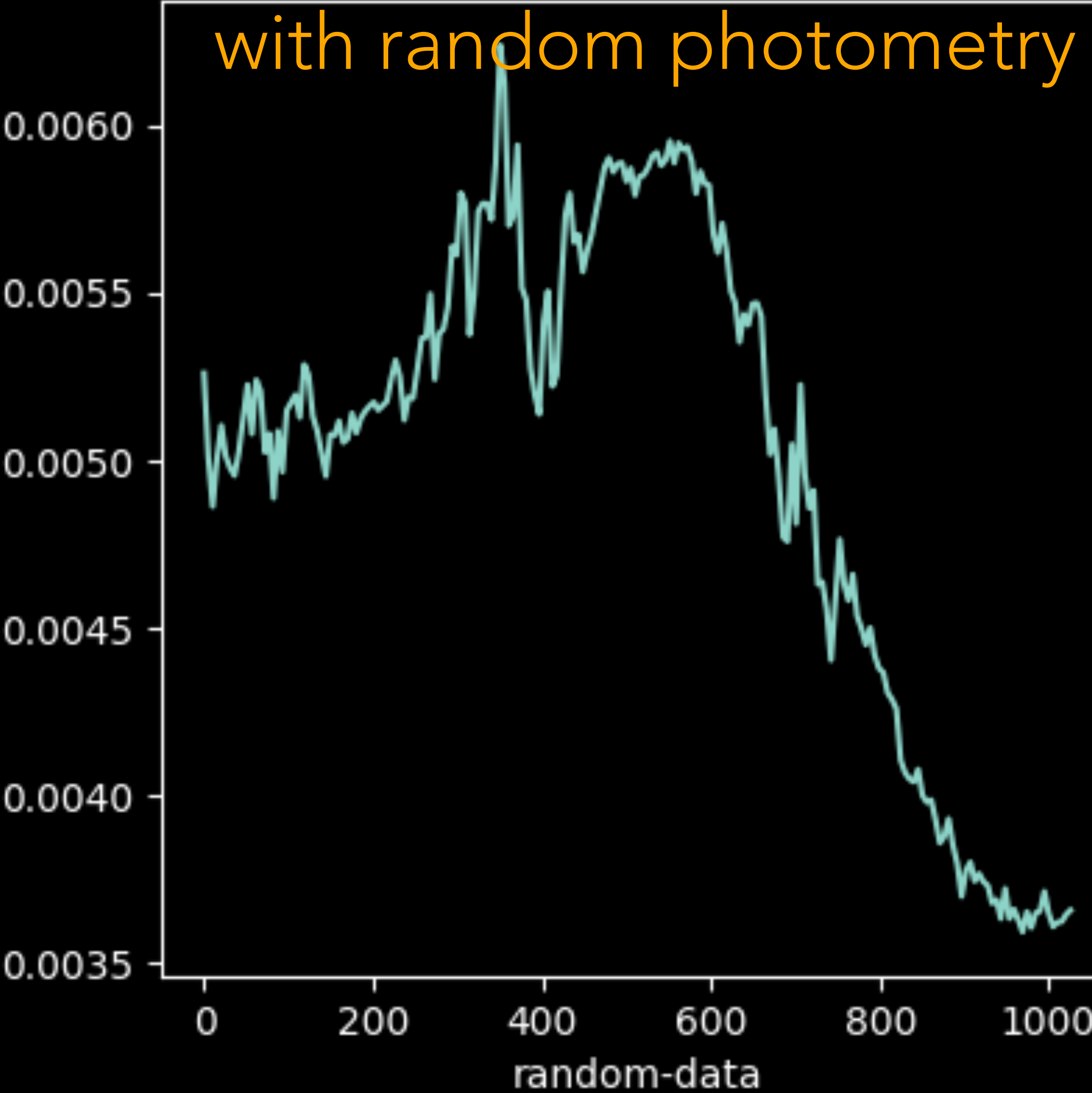


# WHAT DOES THIS LOOK LIKE?

Photometry data crossed with random spectroscopy



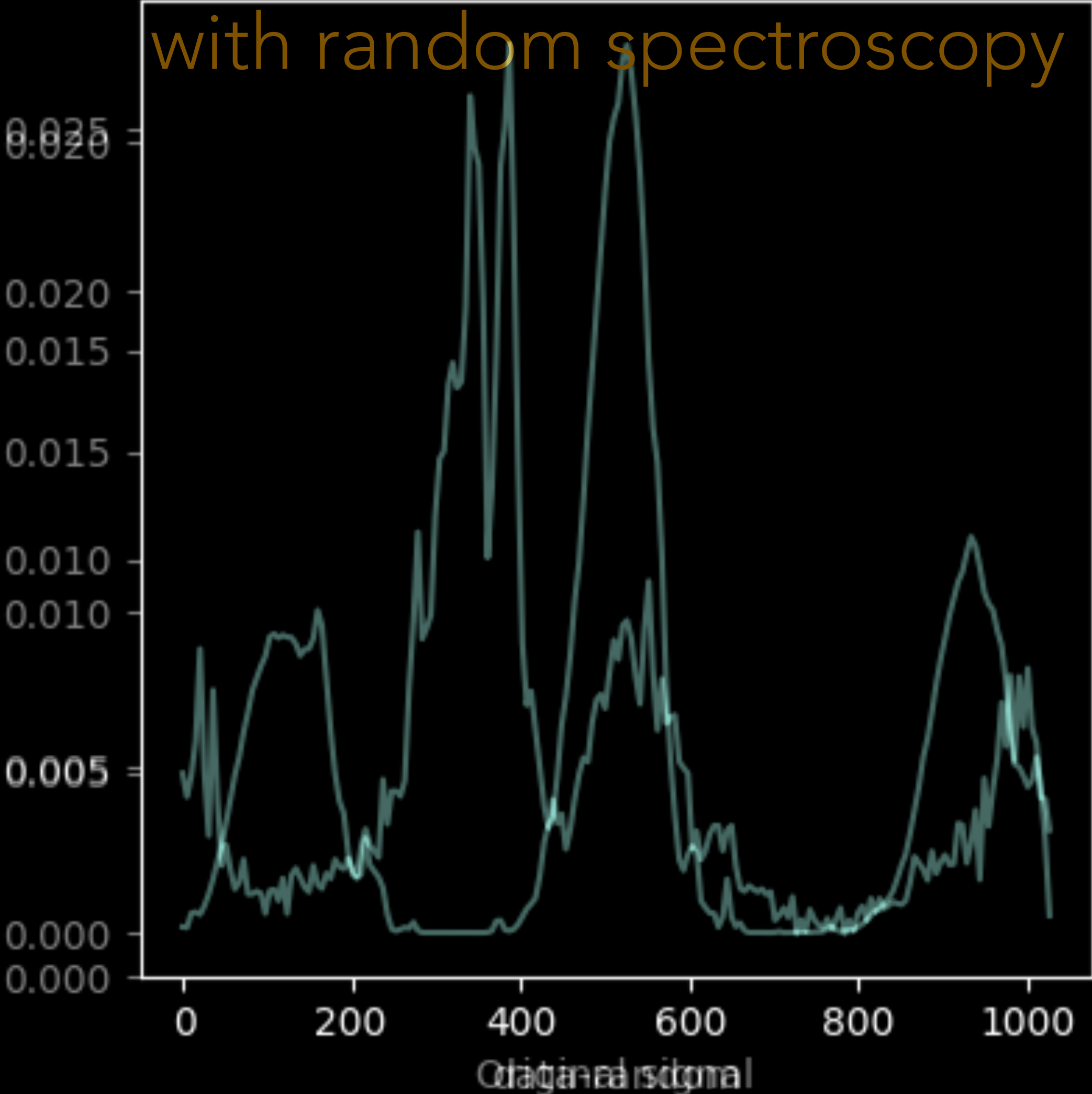
Spectroscopic data crossed with random photometry



# WHAT DOES THIS LOOK LIKE?

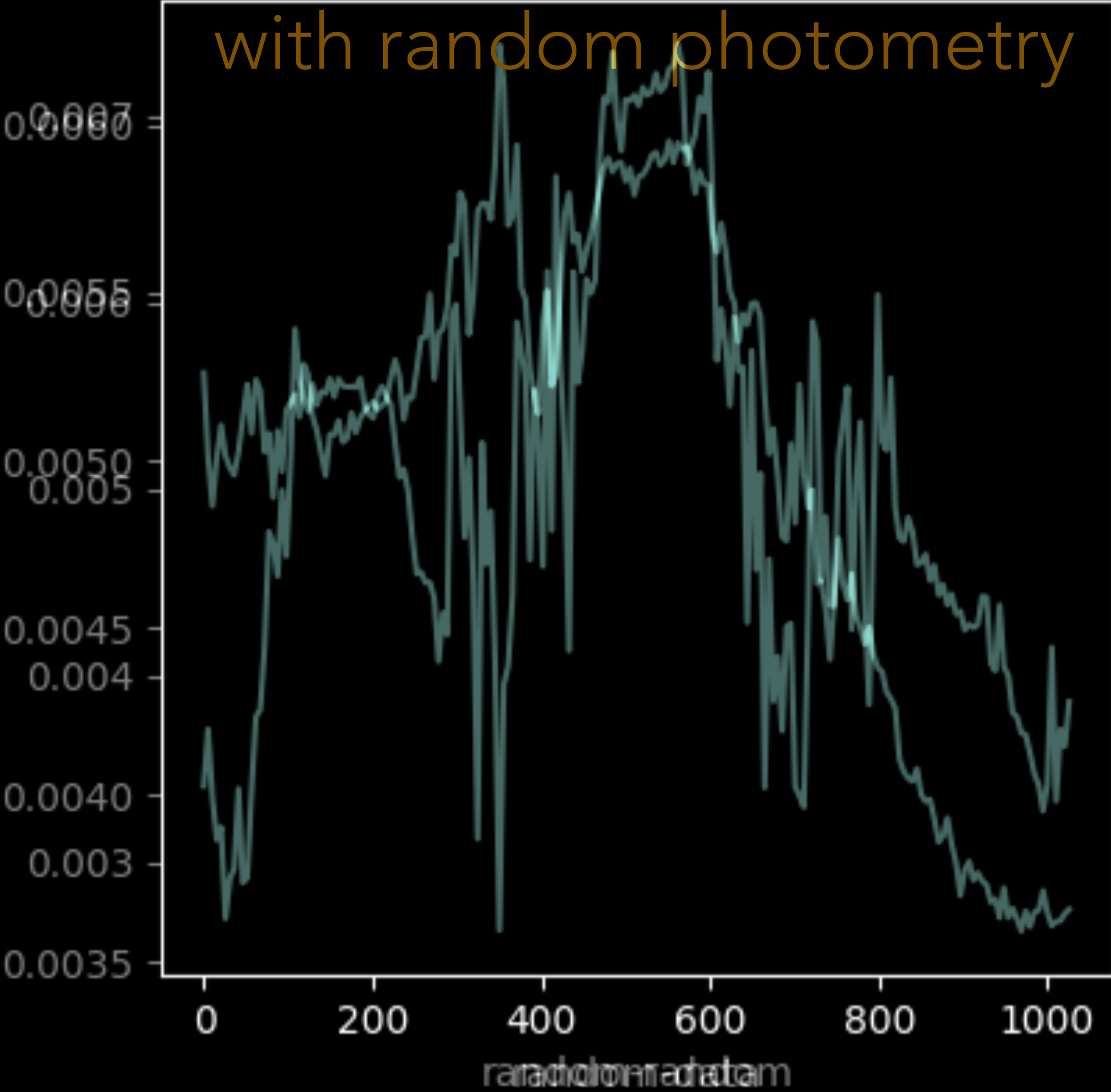
Photometry data crossed

with random spectroscopy



Spectroscopic data crossed

with random photometry





# IS THIS HELPING?

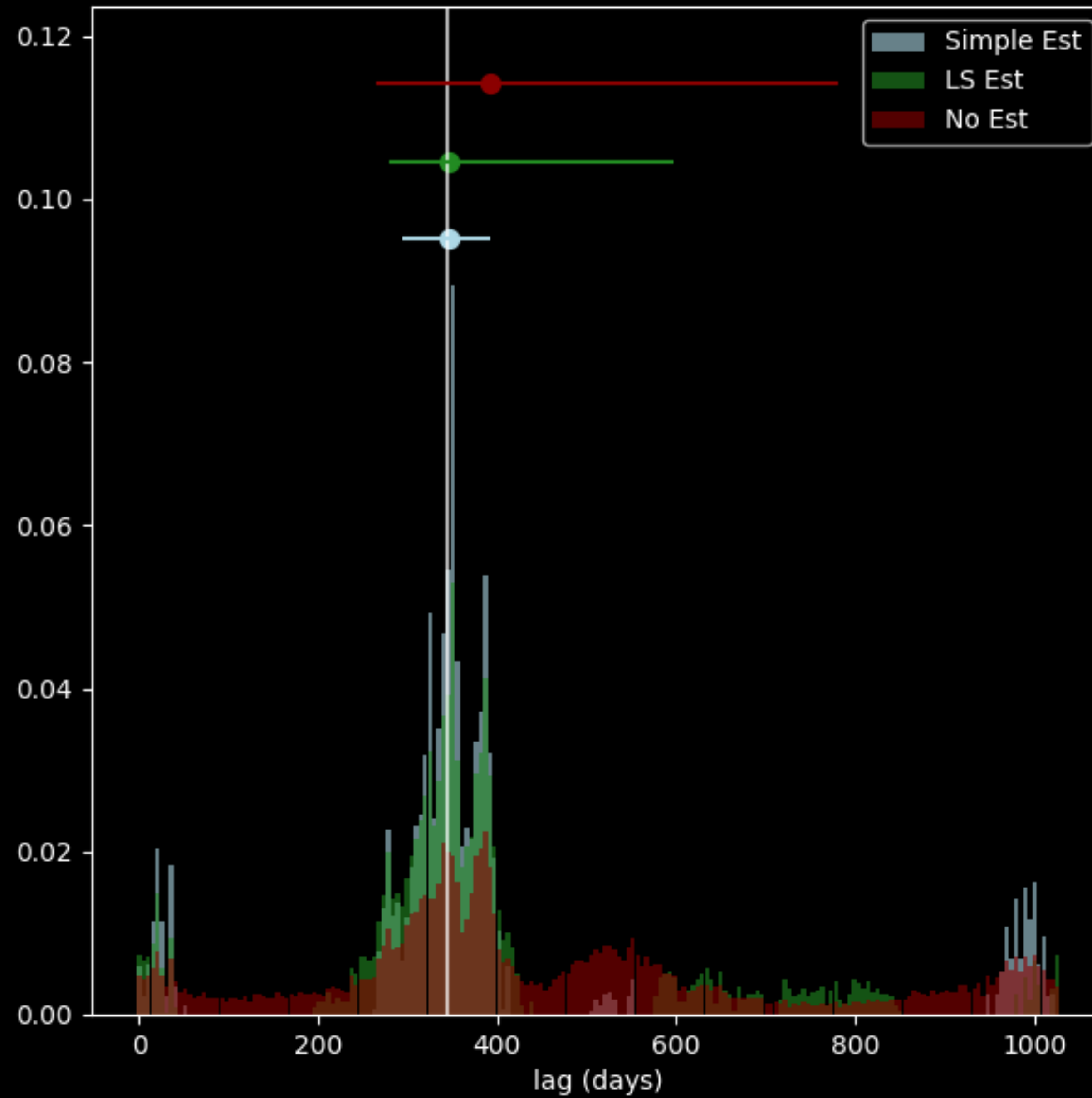
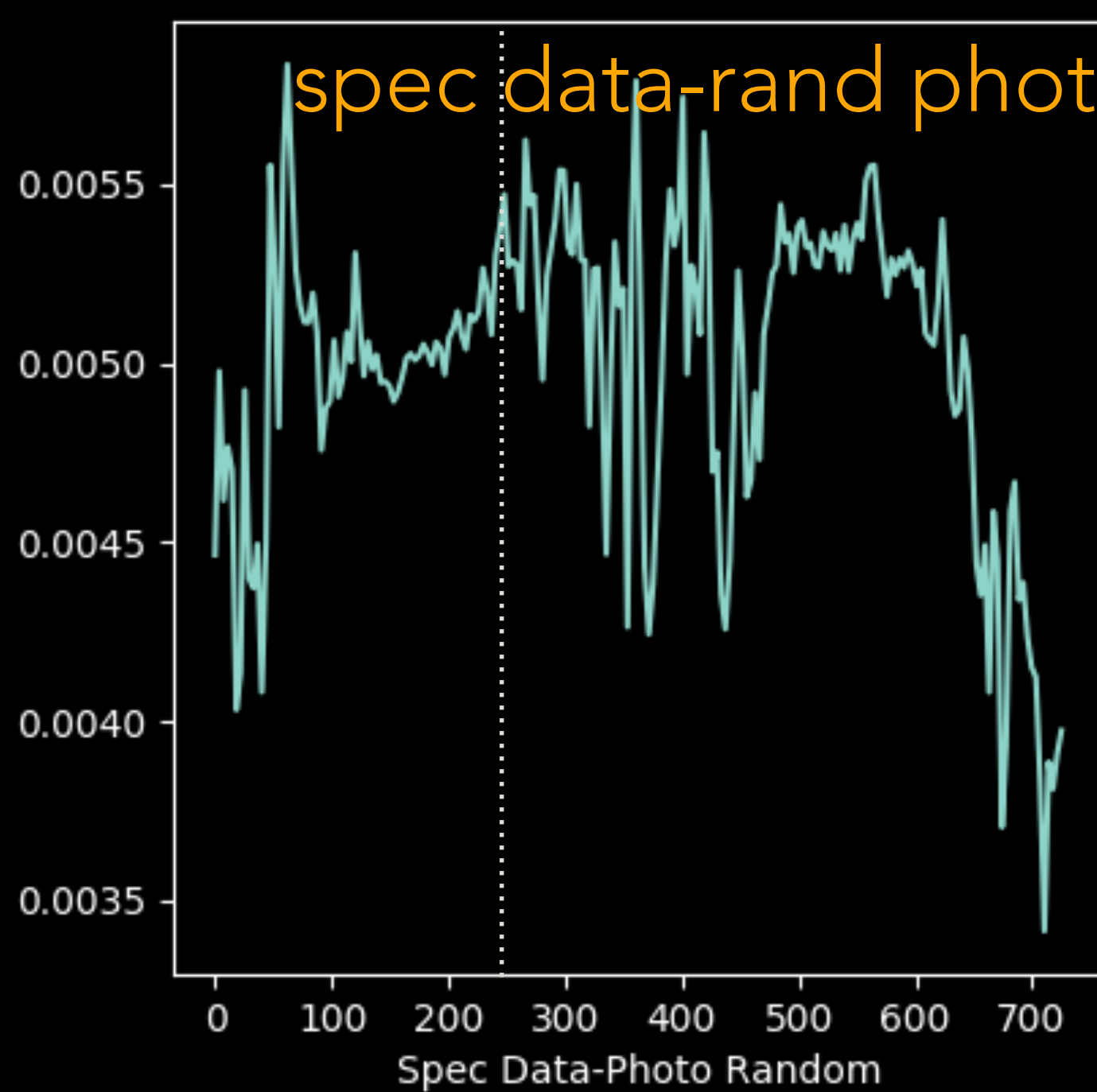
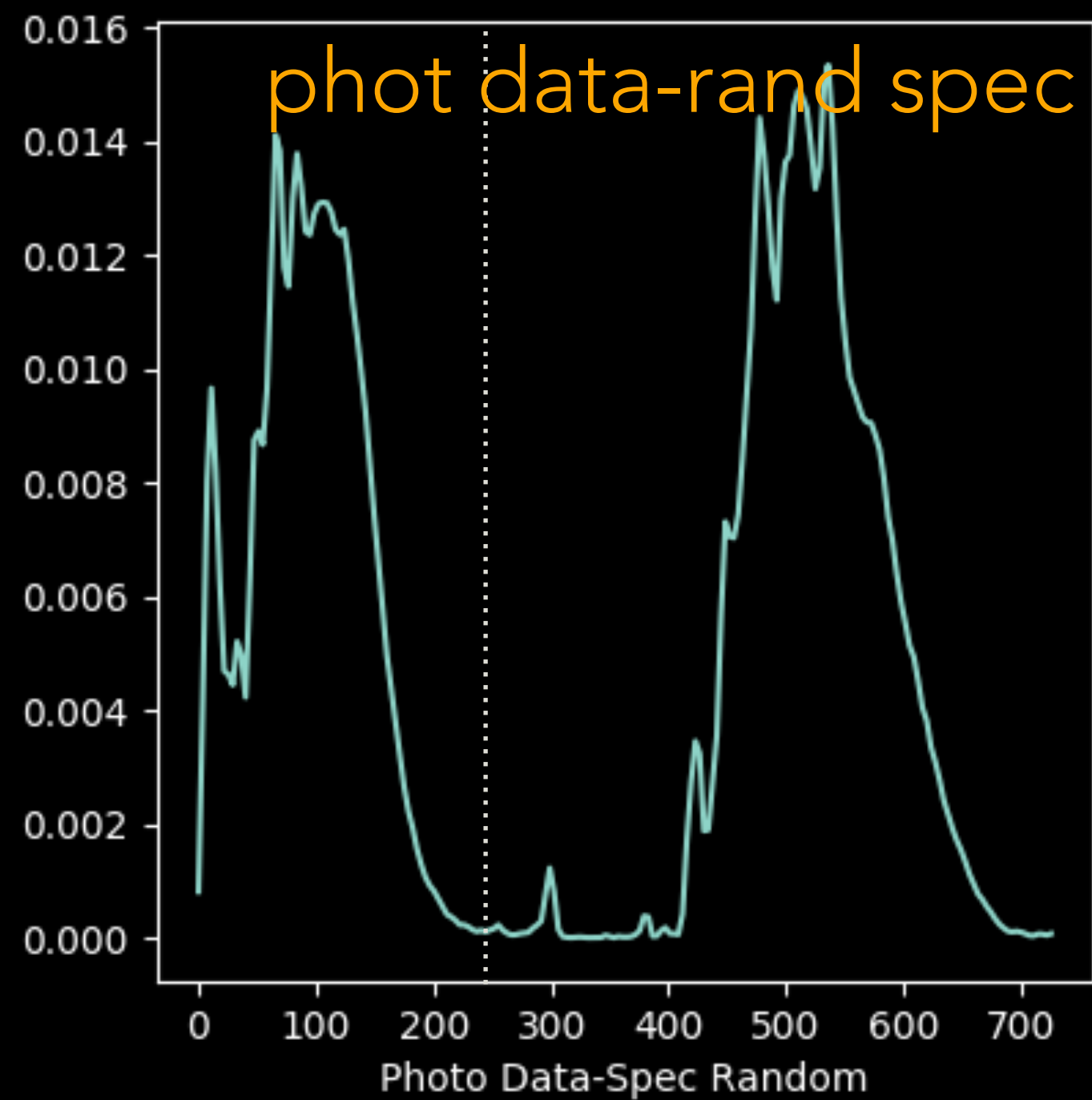
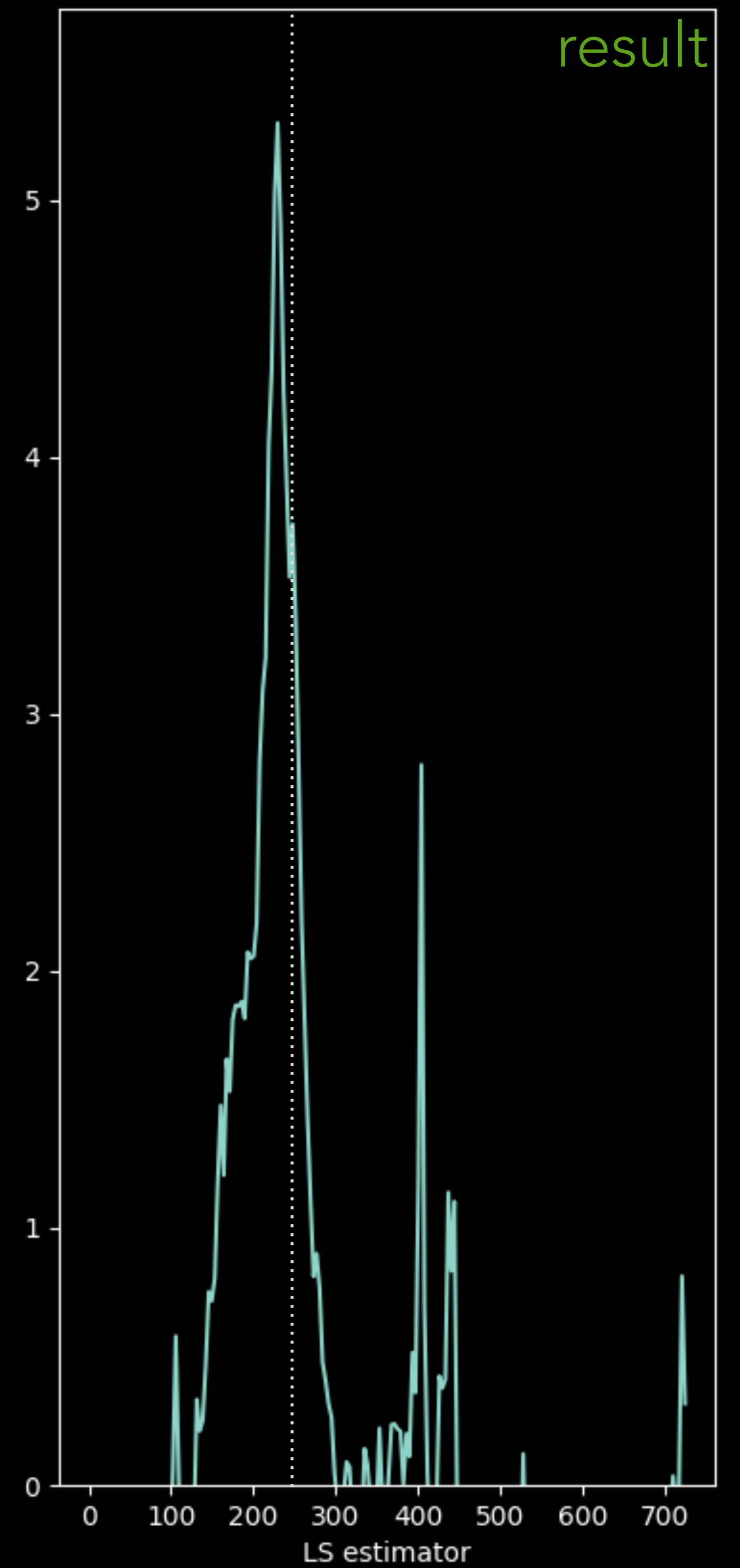
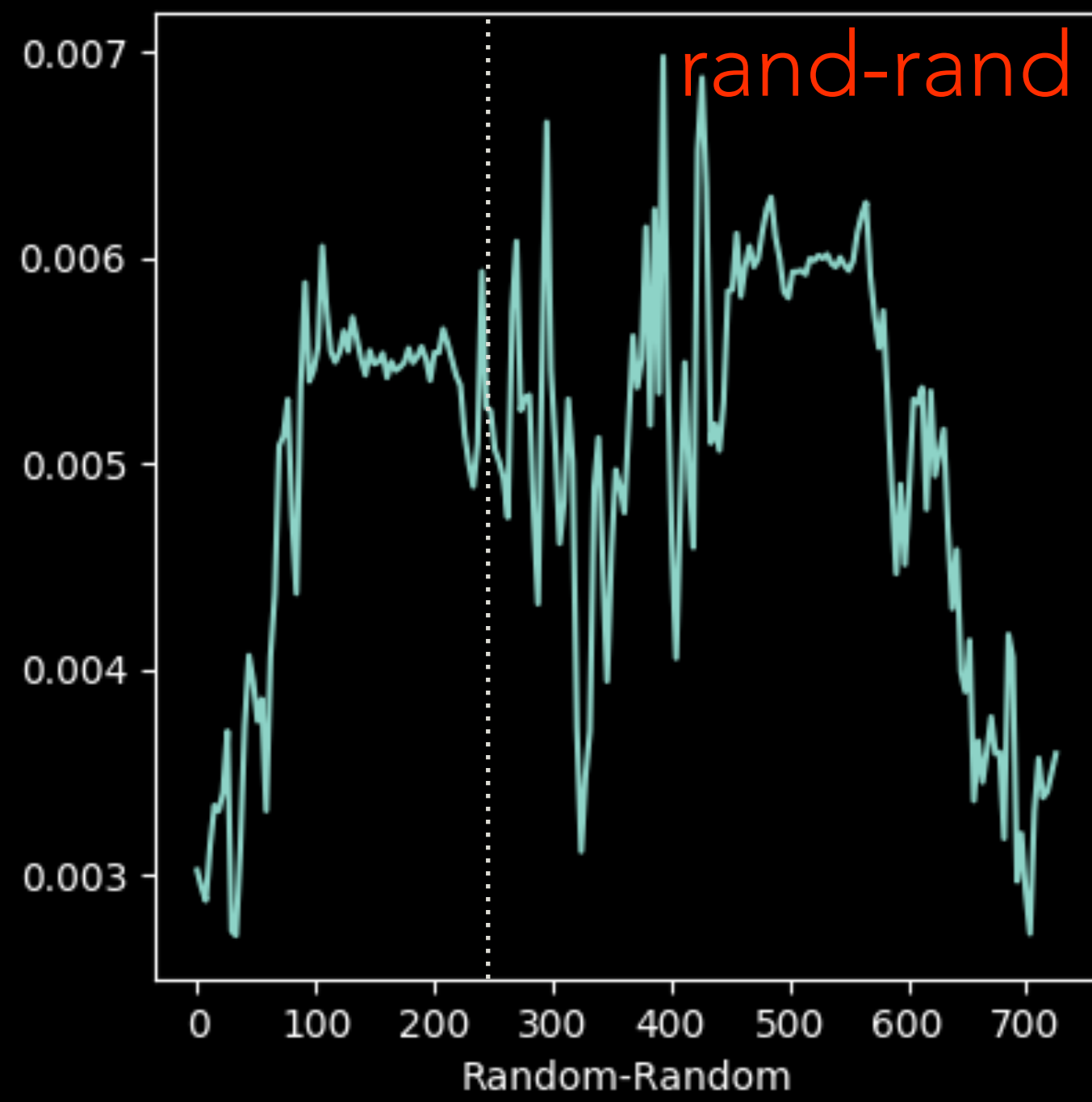
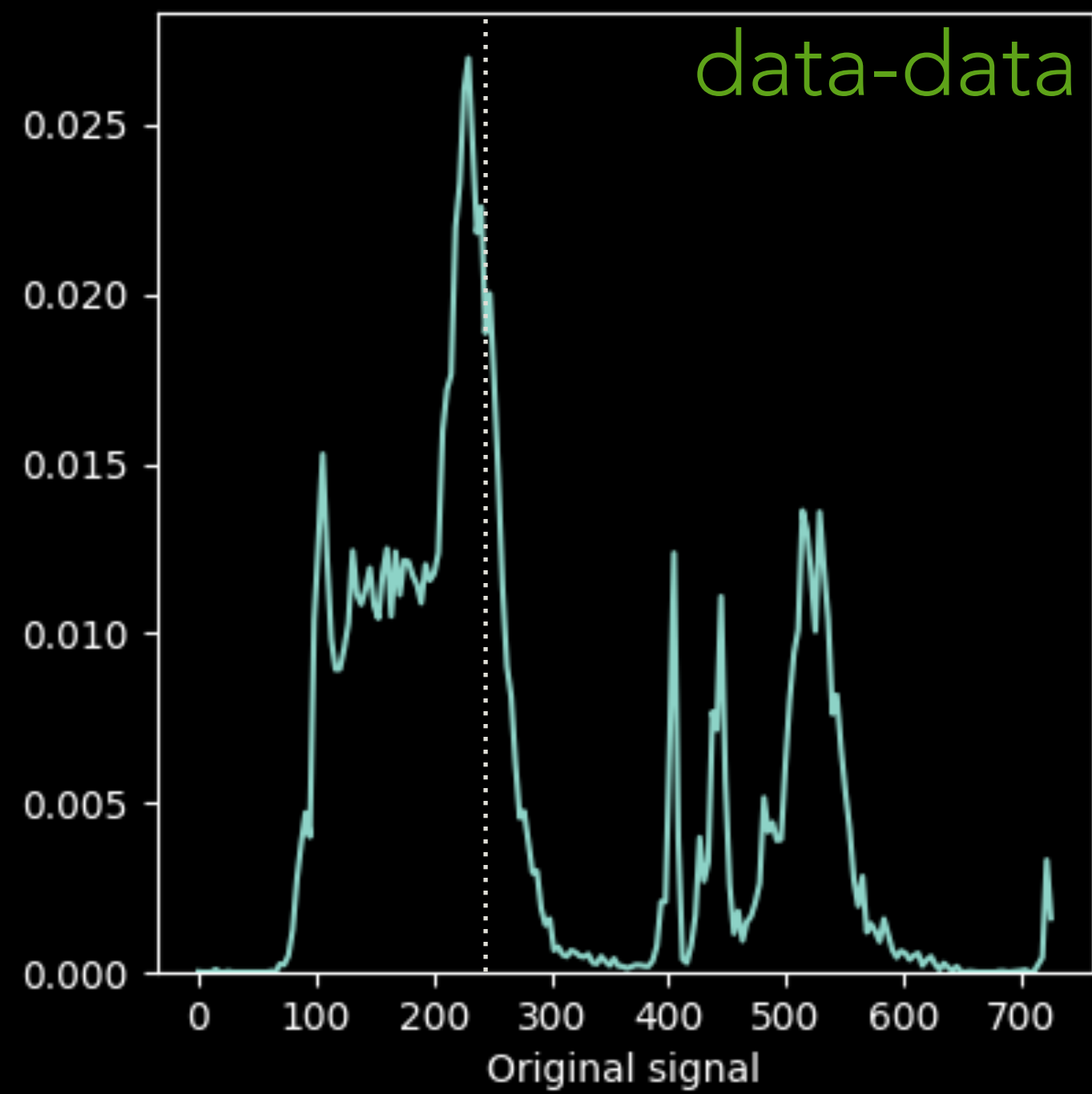
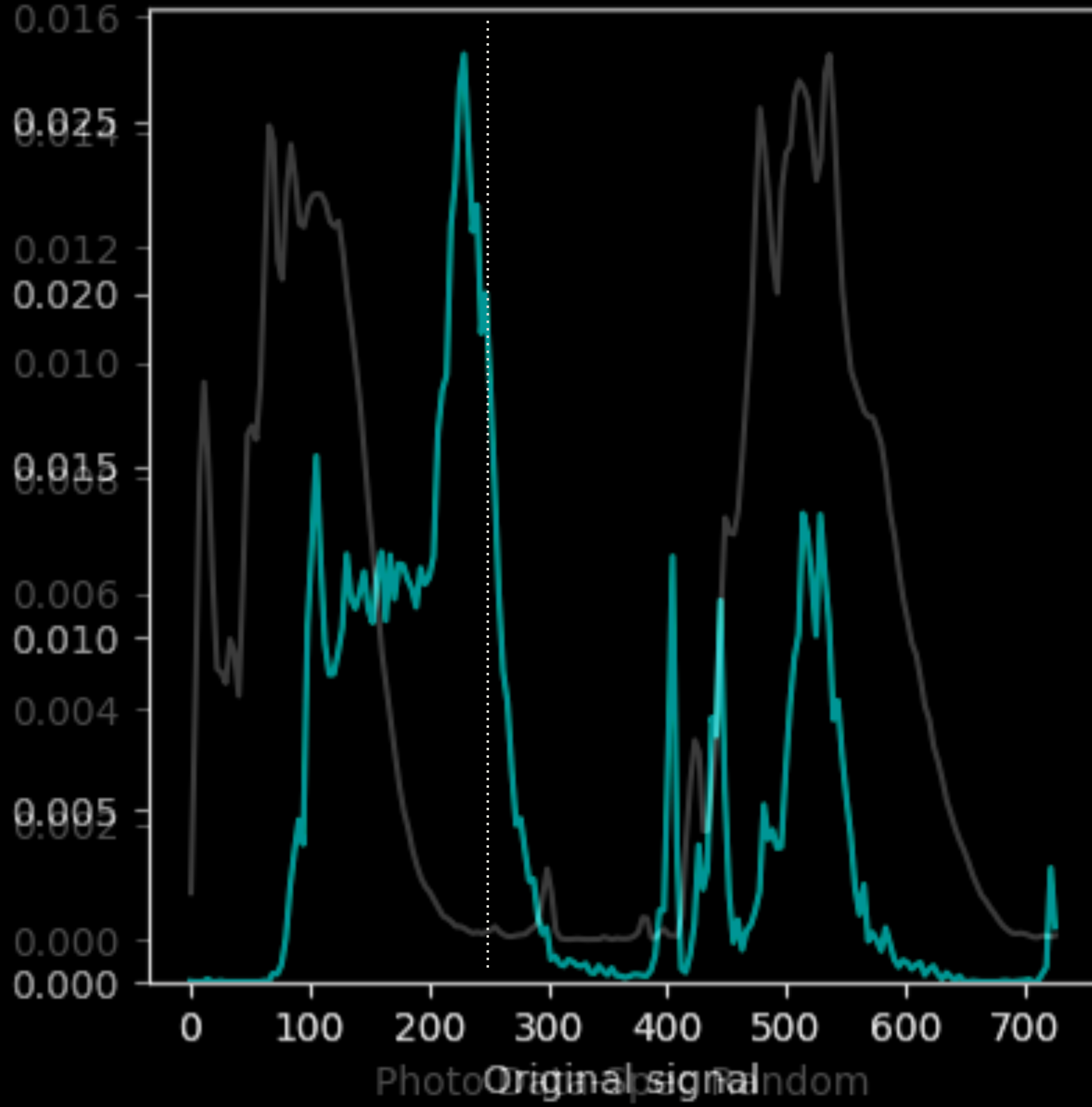


Figure: Andrew Penton

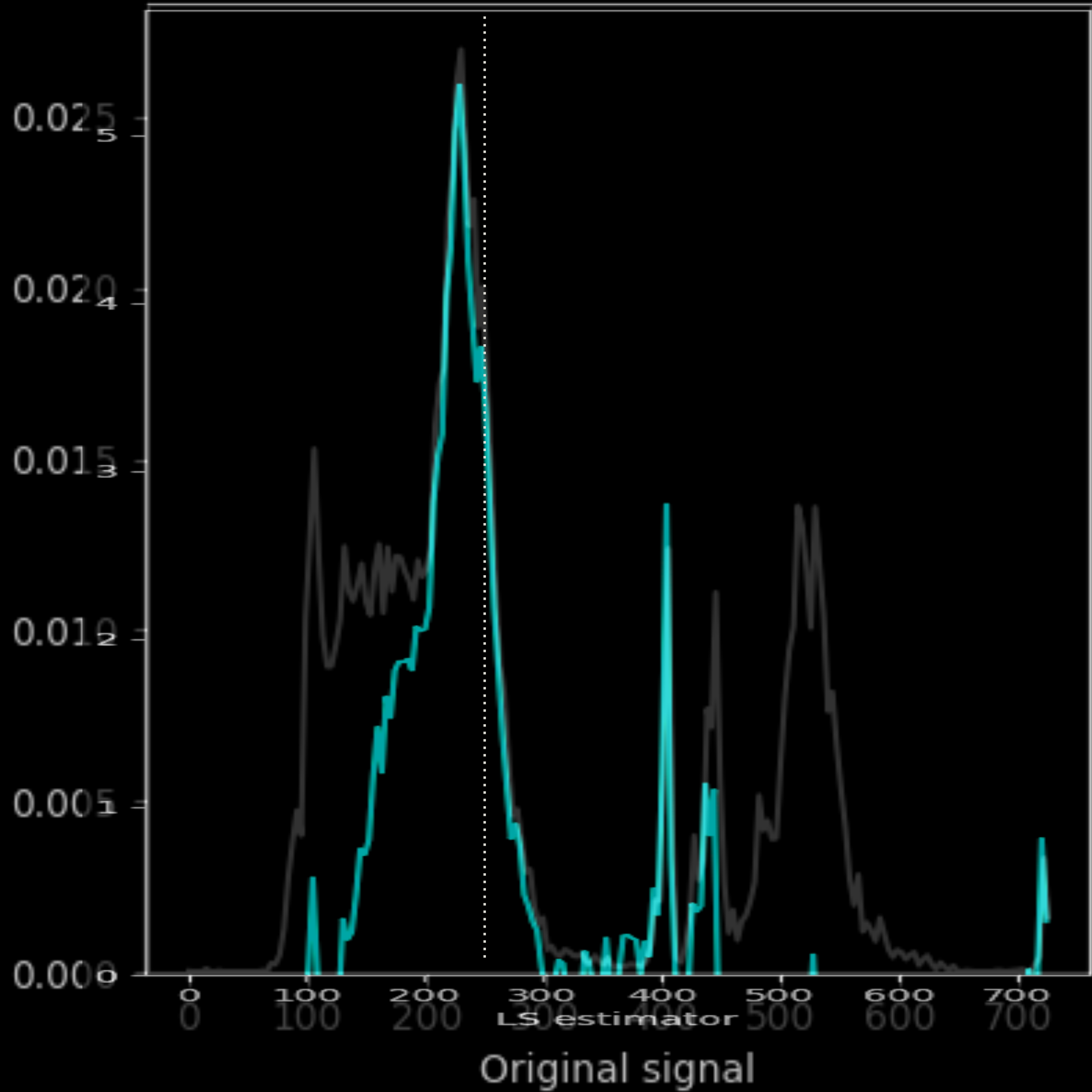




# ORIGINAL WITH RANDOM IN GREY

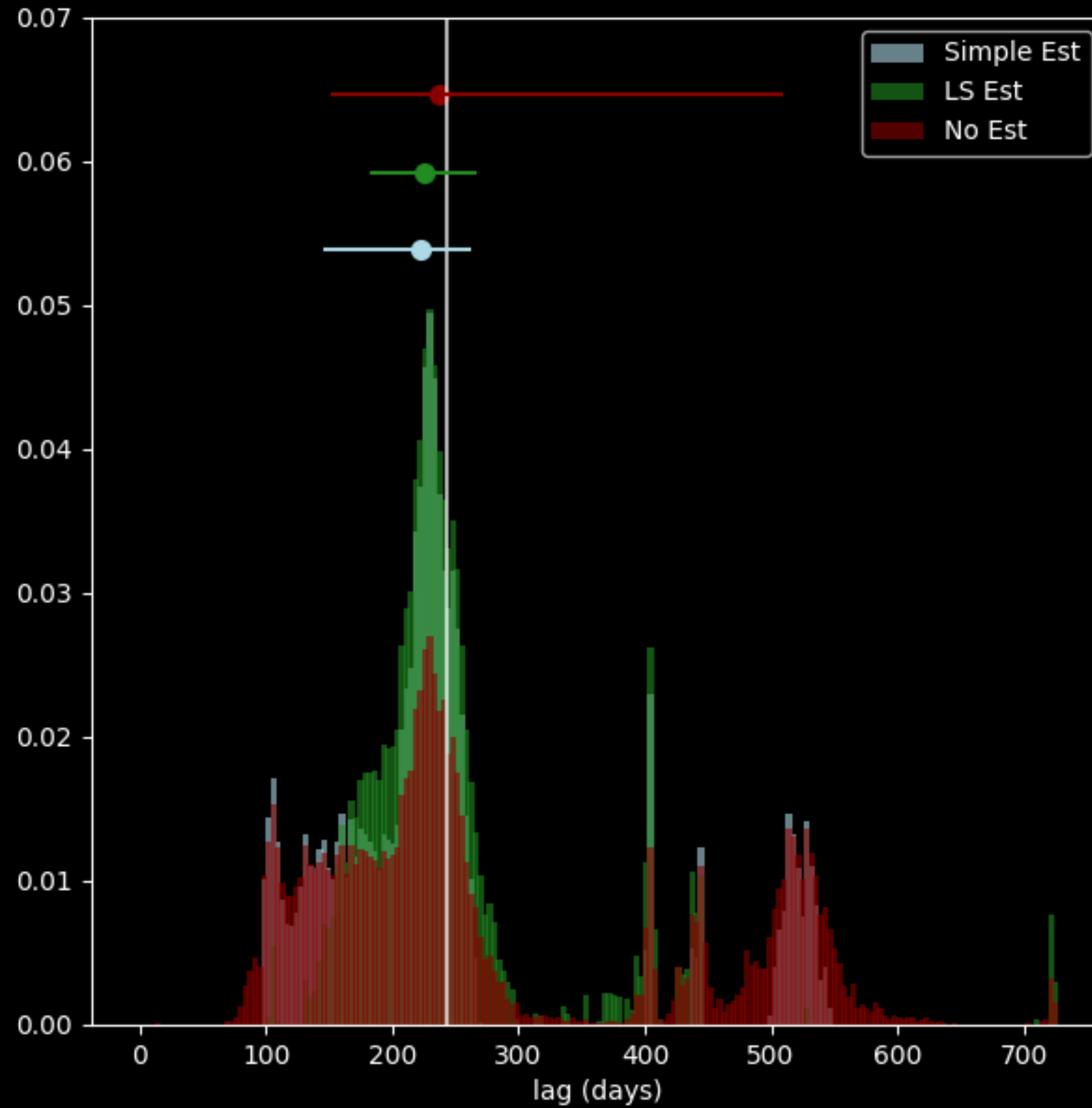


# ORIGINAL IN GREY AND FINAL IN GREEN

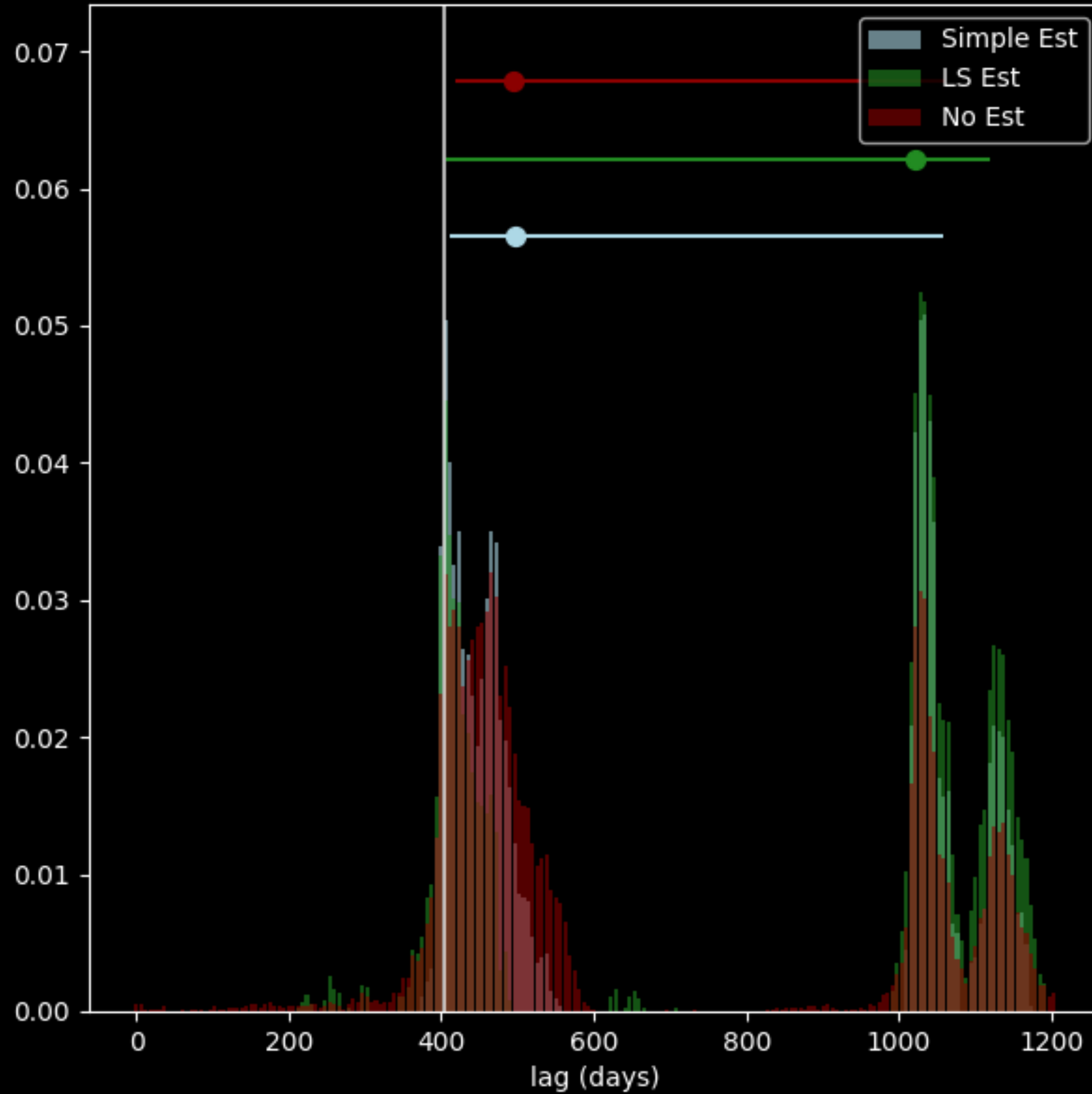




# IS THIS HELPING?



# IS THIS HELPING?





# SUMMARY

- OzDES is targeting **771 AGN** out to  $z=4$
- All spectra public very soon (by end of year hopefully)
- Recovered **first 2 lags** using the **CIV** line
  - Including one at  $z = 2.593$
- Developing the **statistical techniques**
  - Testing on hundreds of **simulations**
  - Generating **quantitative quality criteria** to rank lags from sources
  - Dealing with seasonal gaps and aliasing using **window function estimators**
  - Using an estimator seems to be able to reduce noise in recovered lag signal and reduce the effects of aliasing in our signals
- Preliminary look at year 5 data shows we **should be able to recover almost 200 more!**
- And there is **still data from year 6 to analyse!**



**We are interested in collaborating.  
Contact us!**