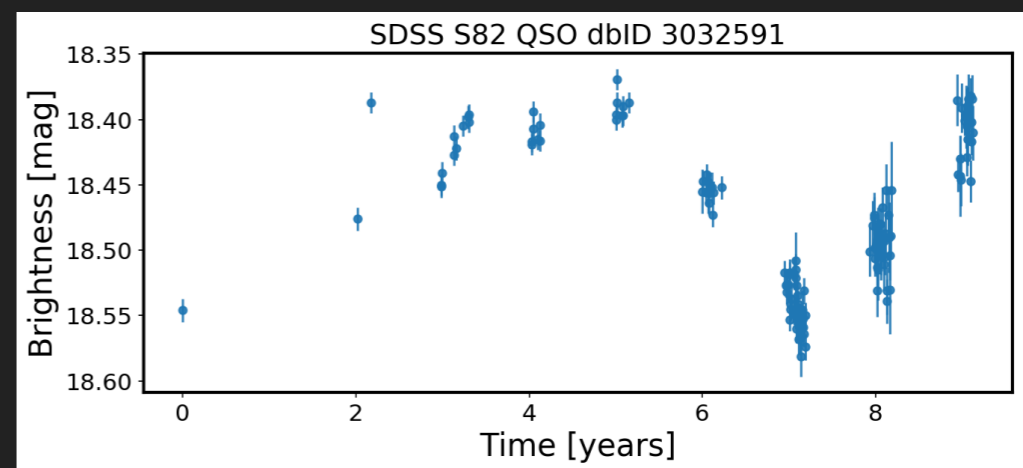
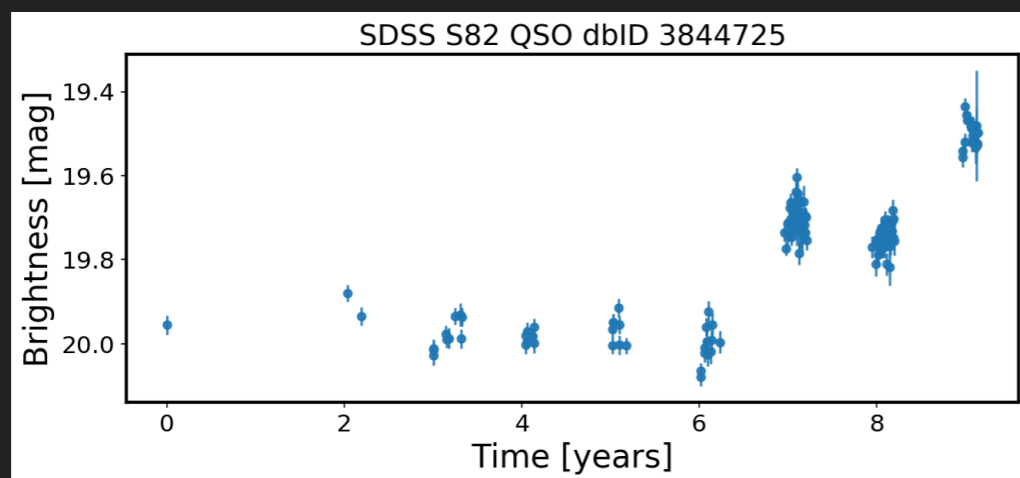
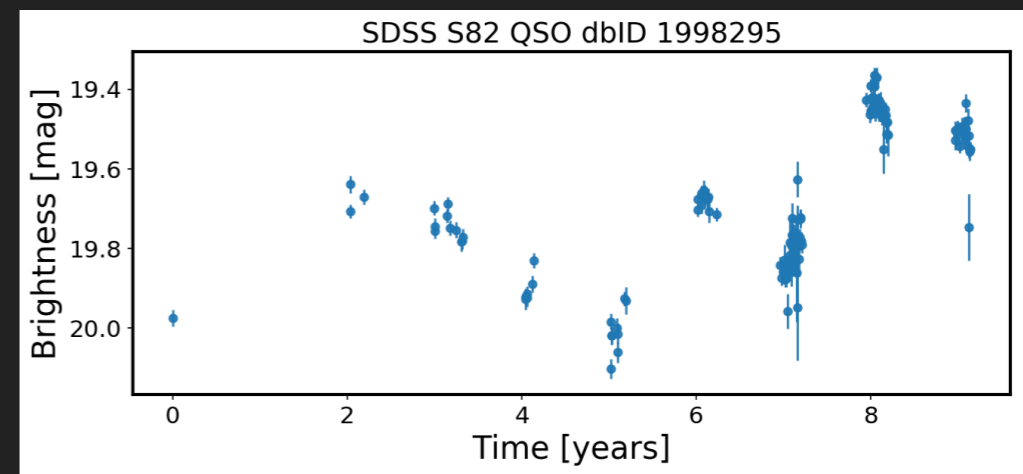
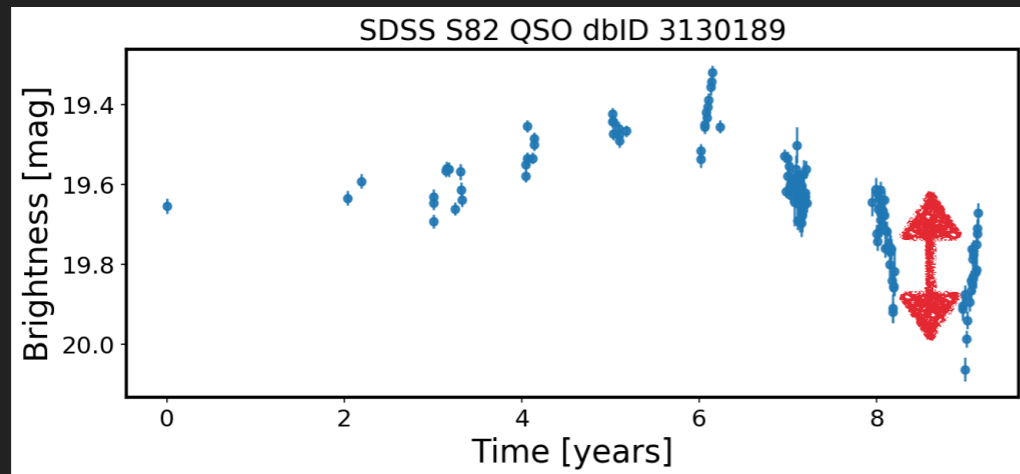
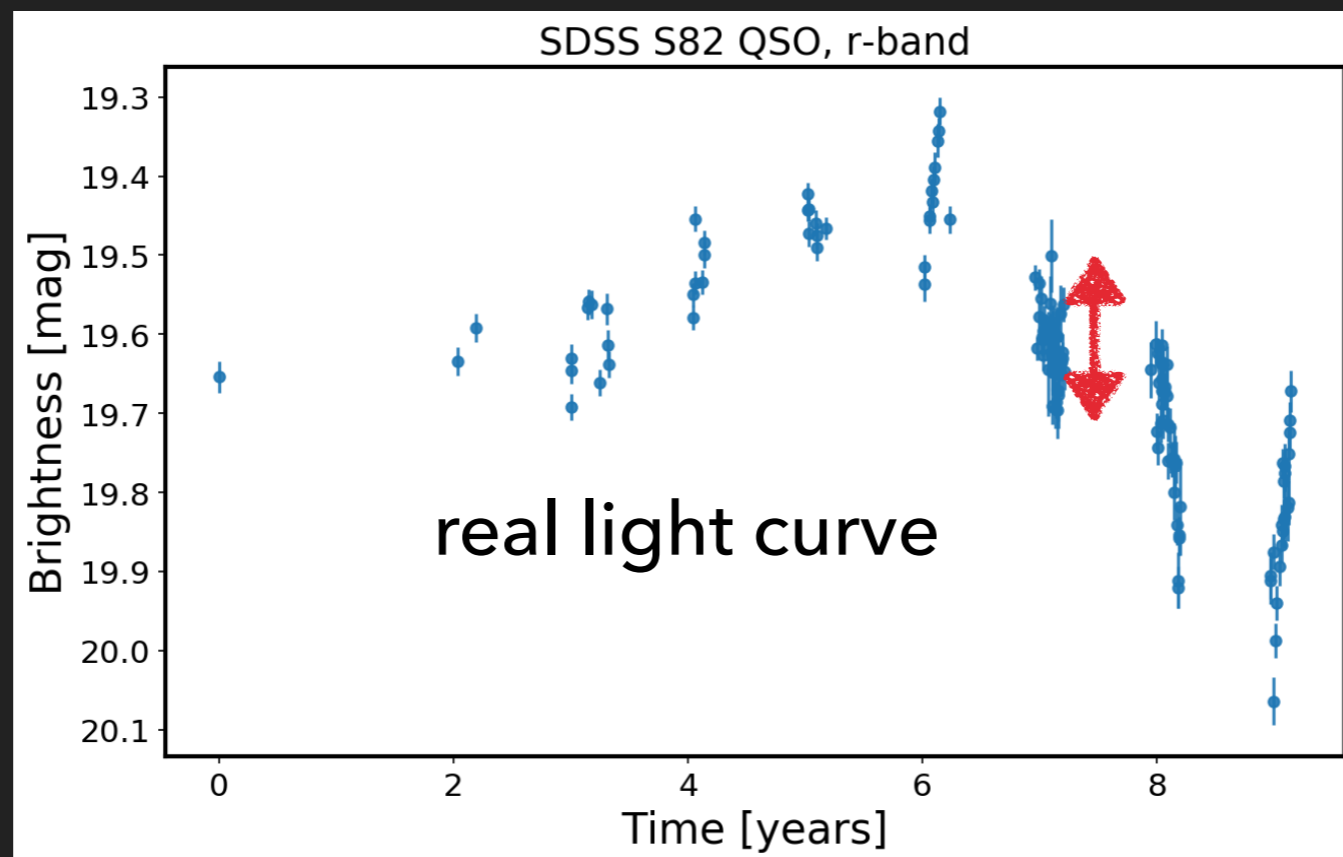

CHANGING LOOK QUASARS

QUASARS – VARIABLE SOURCES

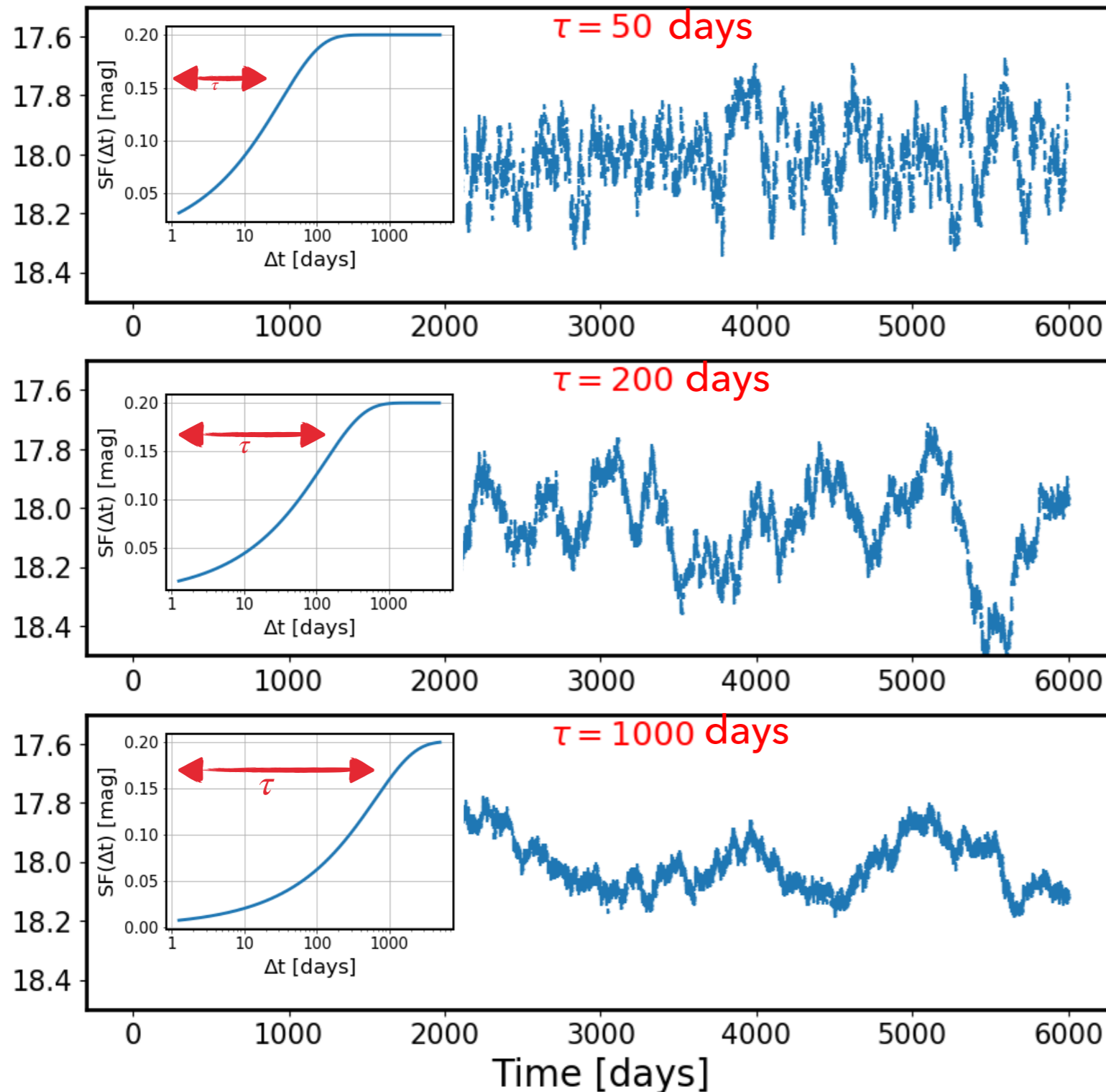


- ▶ root-mean-squared 0.2 mag optical variability over ~ 1 yr
- ▶ stochastic variability : non-repeating pattern in time series (light curve)

- ▶ Damped Random Walk model - a Gaussian process with an exponential covariance matrix
- ▶ SF_∞ : asymptotic amplitude, τ : characteristic time scale

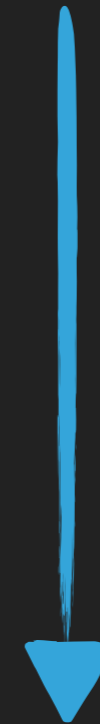


DRW PARAMETERS : TIMESCALE τ

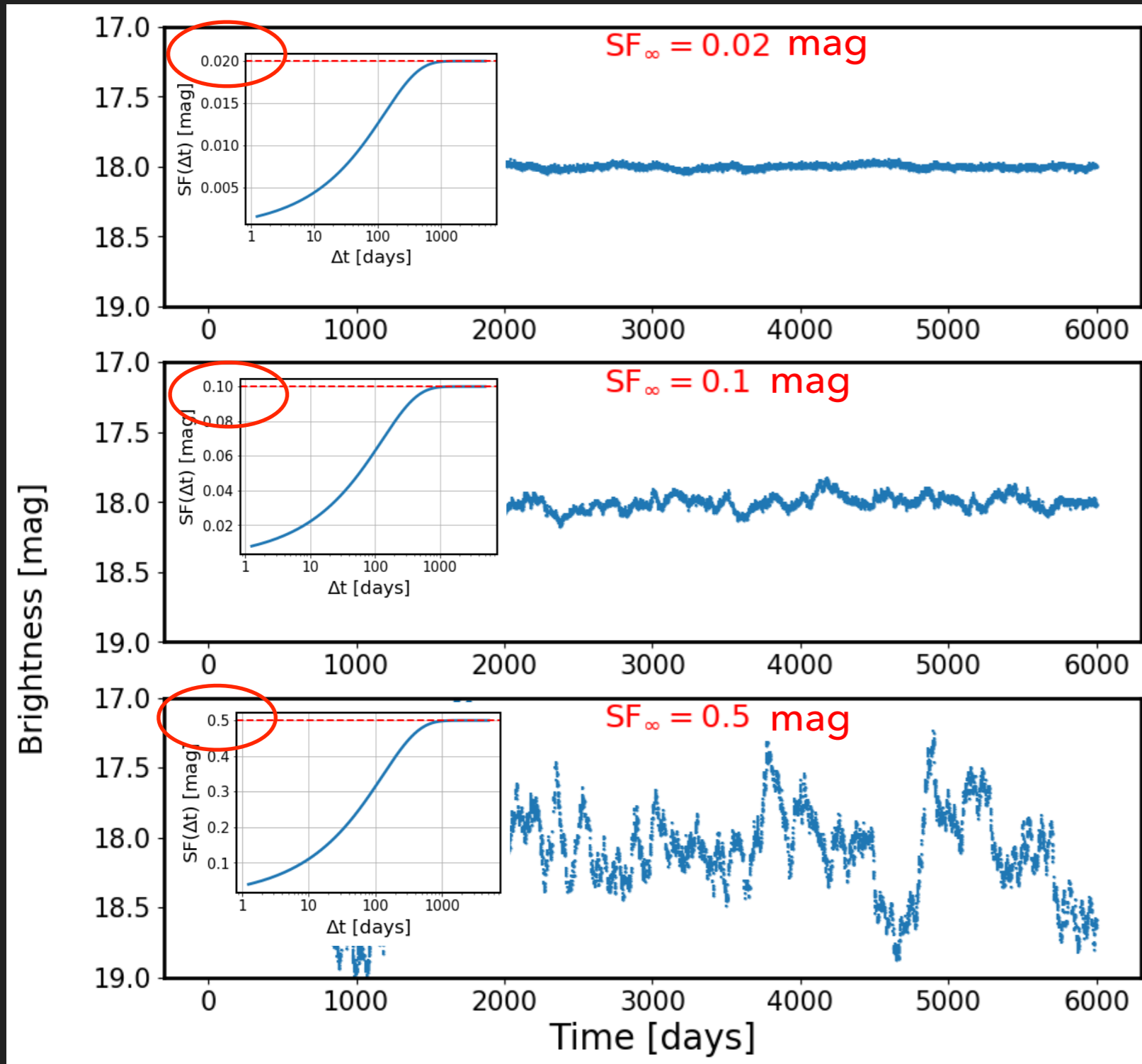


$$SF_{\infty} = 0.2 \text{ mag}$$

as τ increases,
keeping SF_{∞} fixed,
the light curve
appears smoother -
there is much less
short timescale
variability

 τ 

DRW PARAMETERS : ASYMPTOTIC AMPLITUDE SF_{∞}



$\tau = 200$ days

SF_{∞}

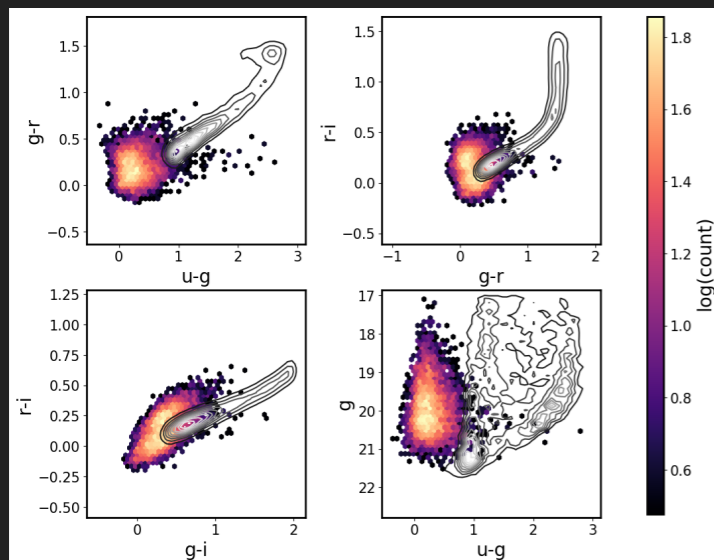
as SF_{∞} increases, the amplitude of variability increases



Any parametric description of quasar variability (eg. DRW)

CLASSIFICATION

ESTIMATION OF PHYSICAL PROPERTIES



DRW
TIMESCALE,
AMPLITUDE



BLACK HOLE MASS,
QSO LUMINOSITY,

Any parametric description of quasar variability (eg. DRW)

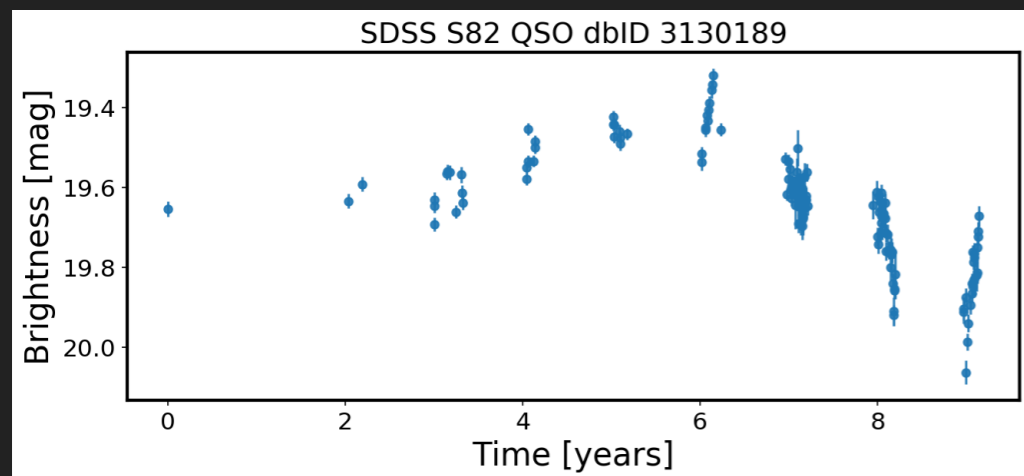
CLASSIFICATION

- ▶ QSO have different DRW parameters than eg. stars or galaxies
- ▶ biases are not very relevant, as long as parameters are constrained (Sesar+2008)

ESTIMATION OF PHYSICAL PROPERTIES

- ▶ Utilizing multi-dimensional correlations between measured parameters (eg. τ , SF_{∞}), and physical quantities (black hole mass, quasar luminosity)
- ▶ biases are **important** as they affect inferred physical properties (MacLeod+2010)

HOW TO IMPROVE RETRIEVAL OF DRW PARAMETERS?



baseline = longest Δt

- ▶ Studies showed that extending the light curve baseline affects DRW parameter recovery (Kozłowski+2016)

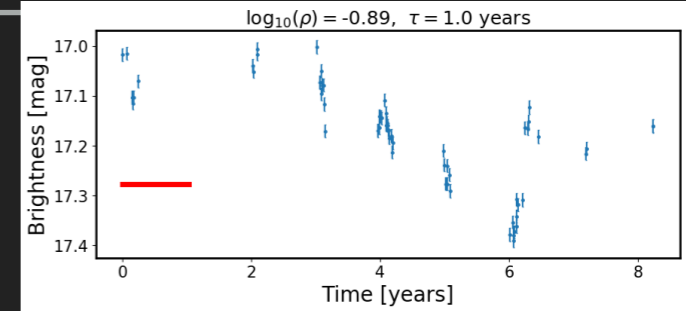
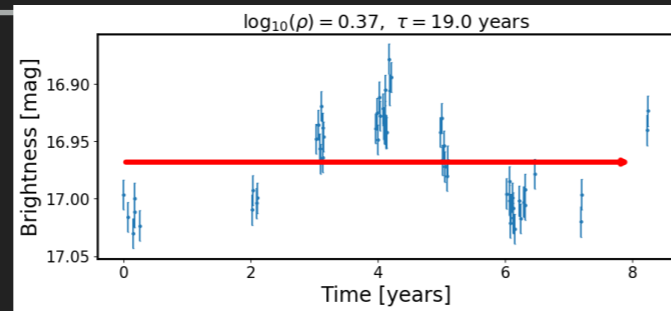
- ▶ We parametrize the ratio of DRW characteristic timescale to baseline:

$$\rho = \text{timescale} / \text{baseline}$$

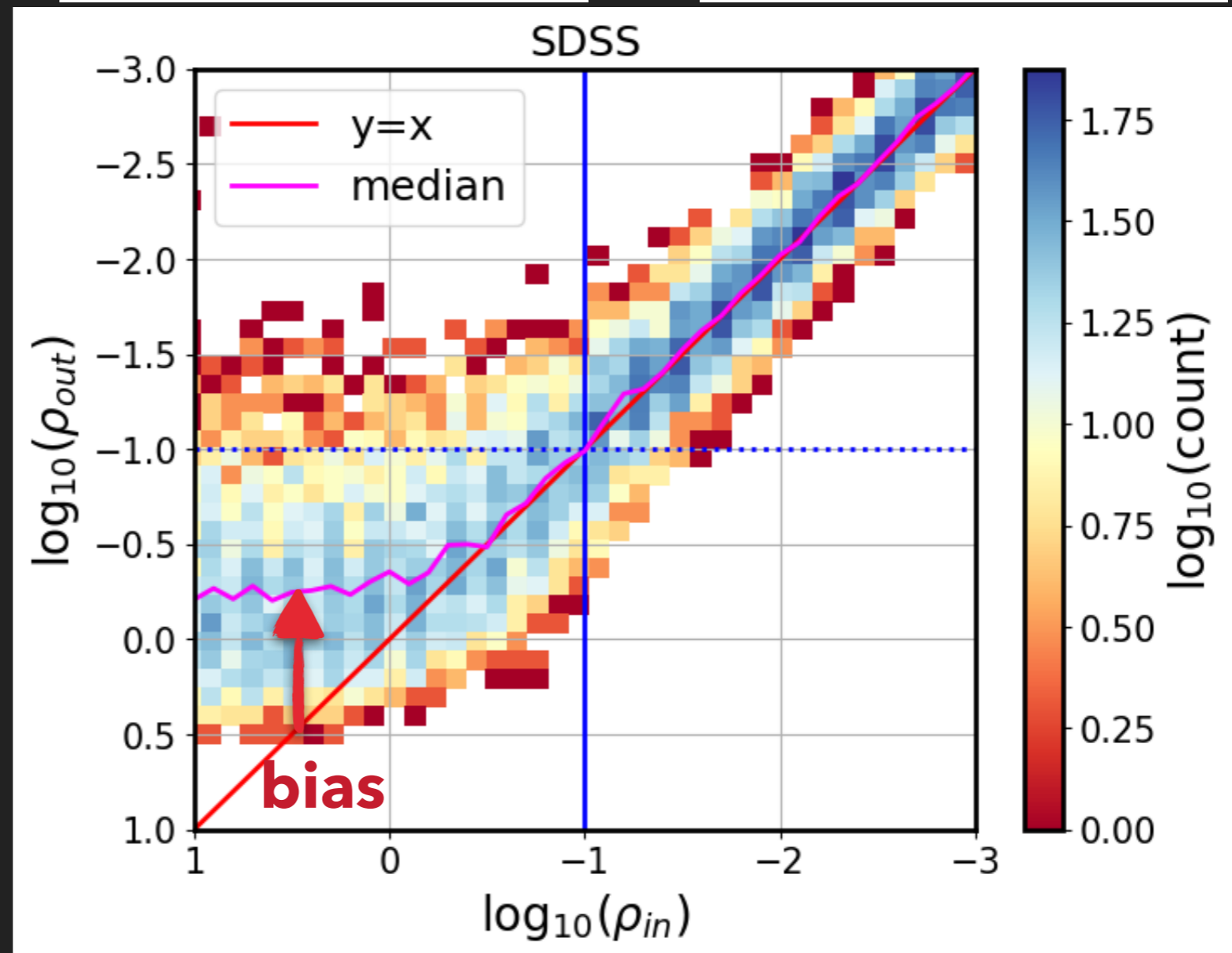
- ▶ We simulate light curves with different ρ , and compare input to fit results : ρ_{in} to

$$\rho_{out}$$

WHAT AFFECTS PARAMETER RECOVERY?



- ▶ $\rho = \tau / \text{baseline}$
- ▶ vary input τ to probe a range of ρ
- ▶ cadence is less relevant than the span of light curve



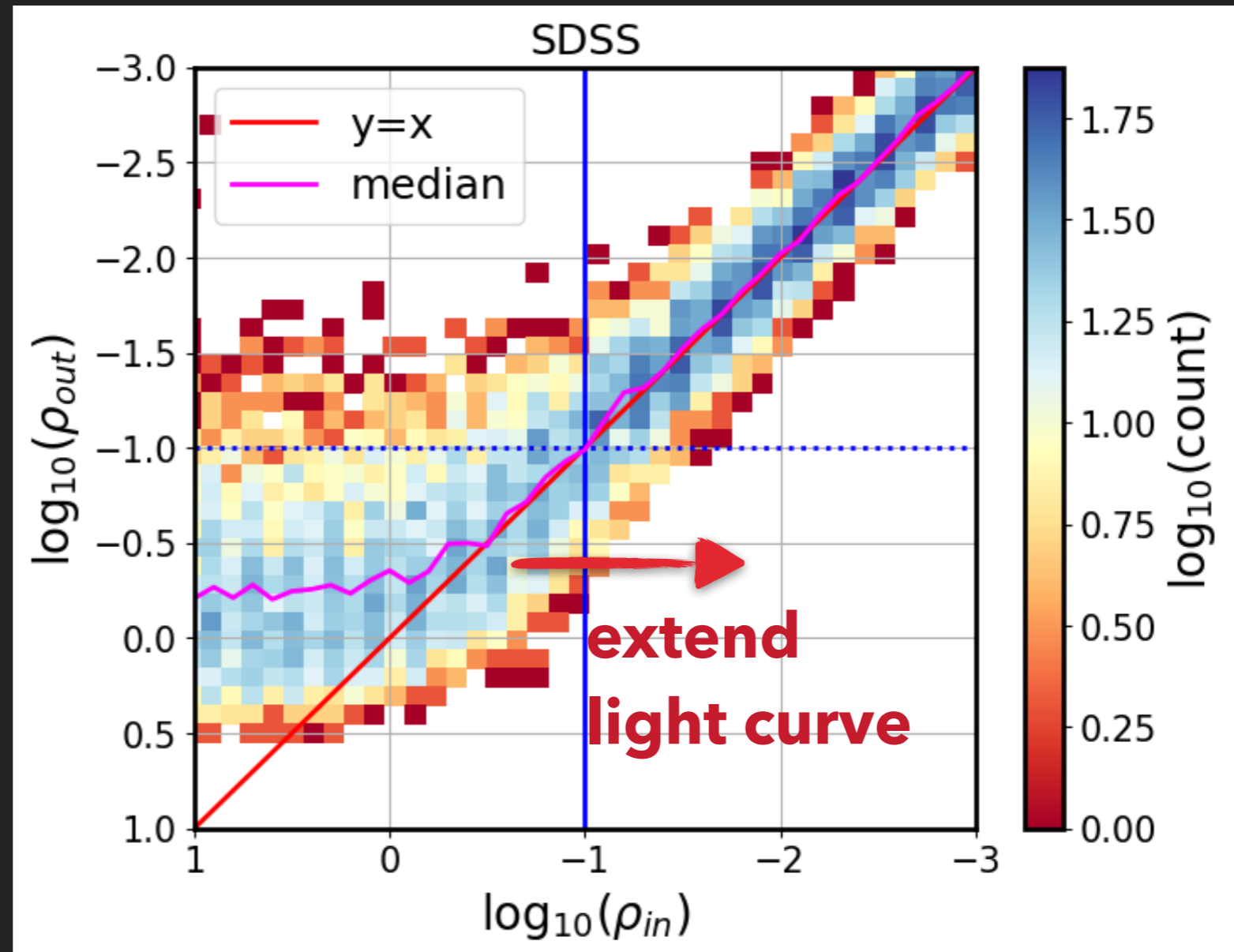
large τ /
short baseline



small τ /
long baseline

WHAT AFFECTS PARAMETER RECOVERY?

- ▶ $\rho = \tau / \text{baseline}$
- ▶ vary input τ to probe a range of ρ
- ▶ cadence is less relevant than the **span of light curve**

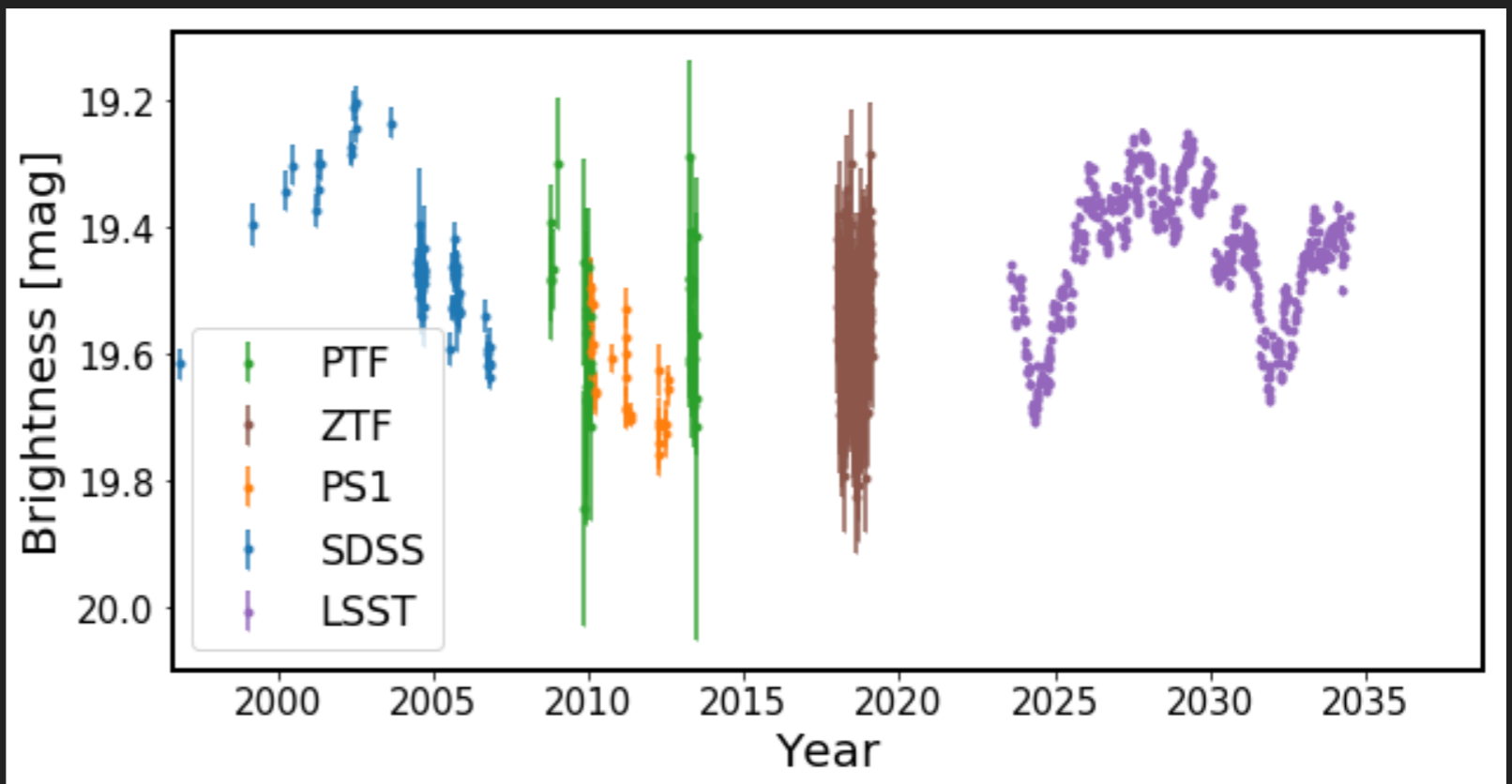
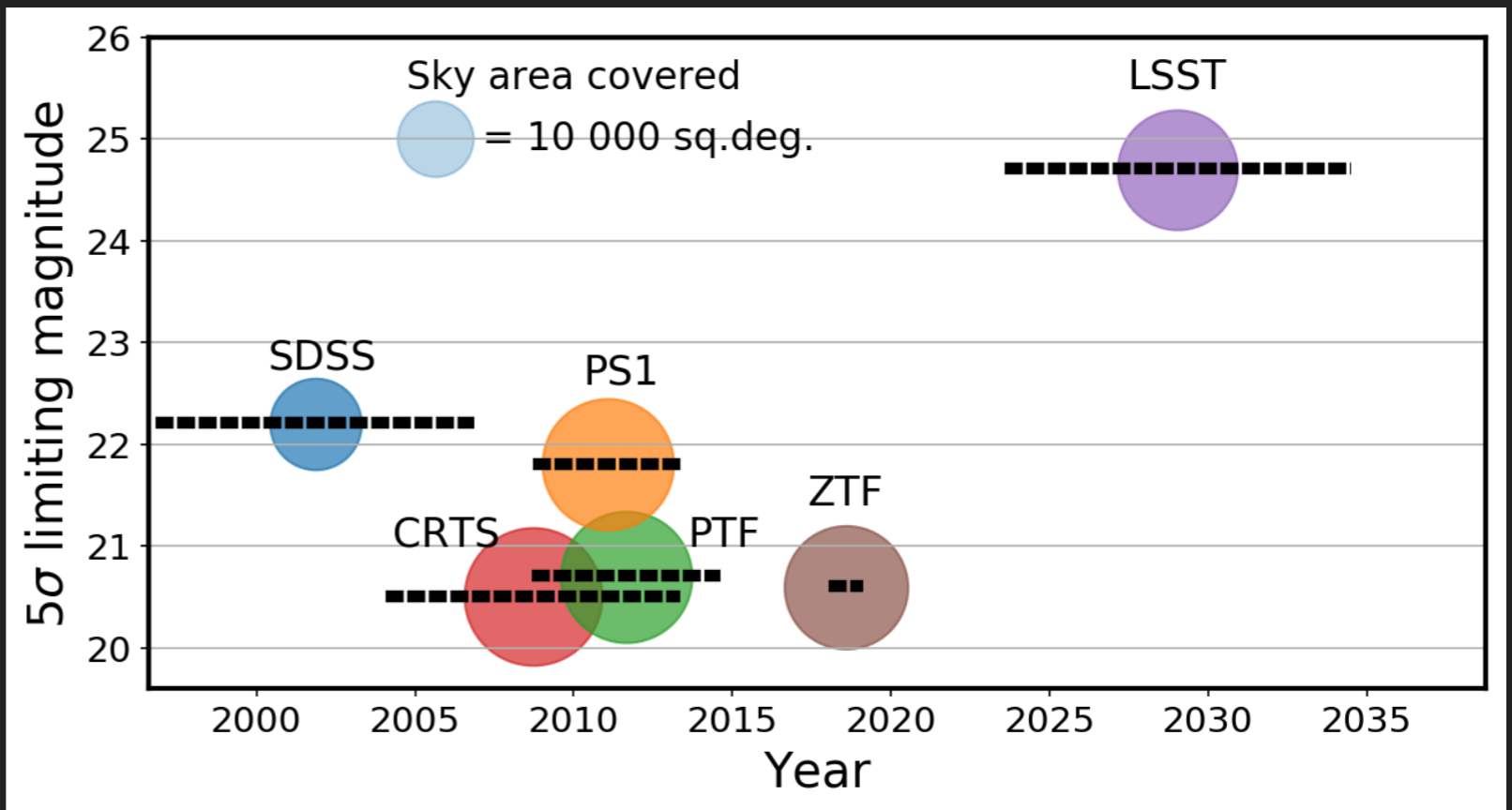


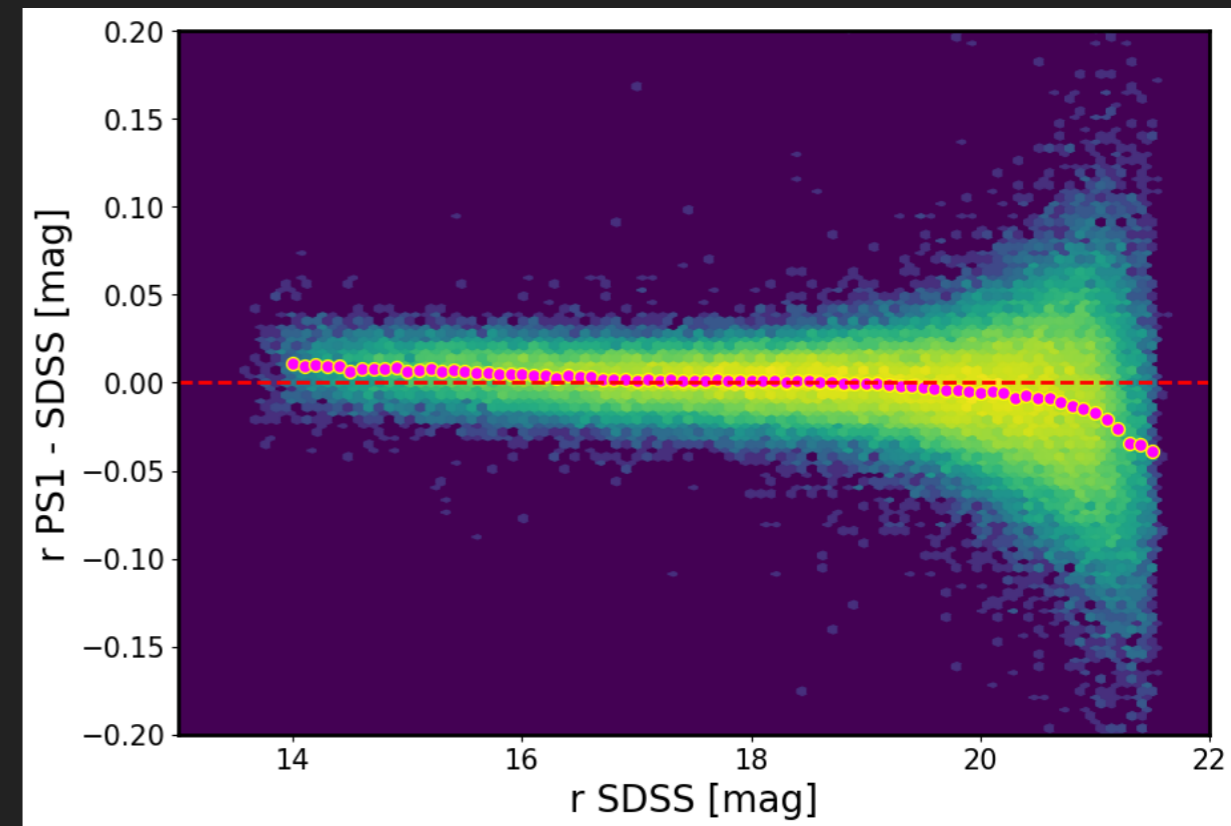
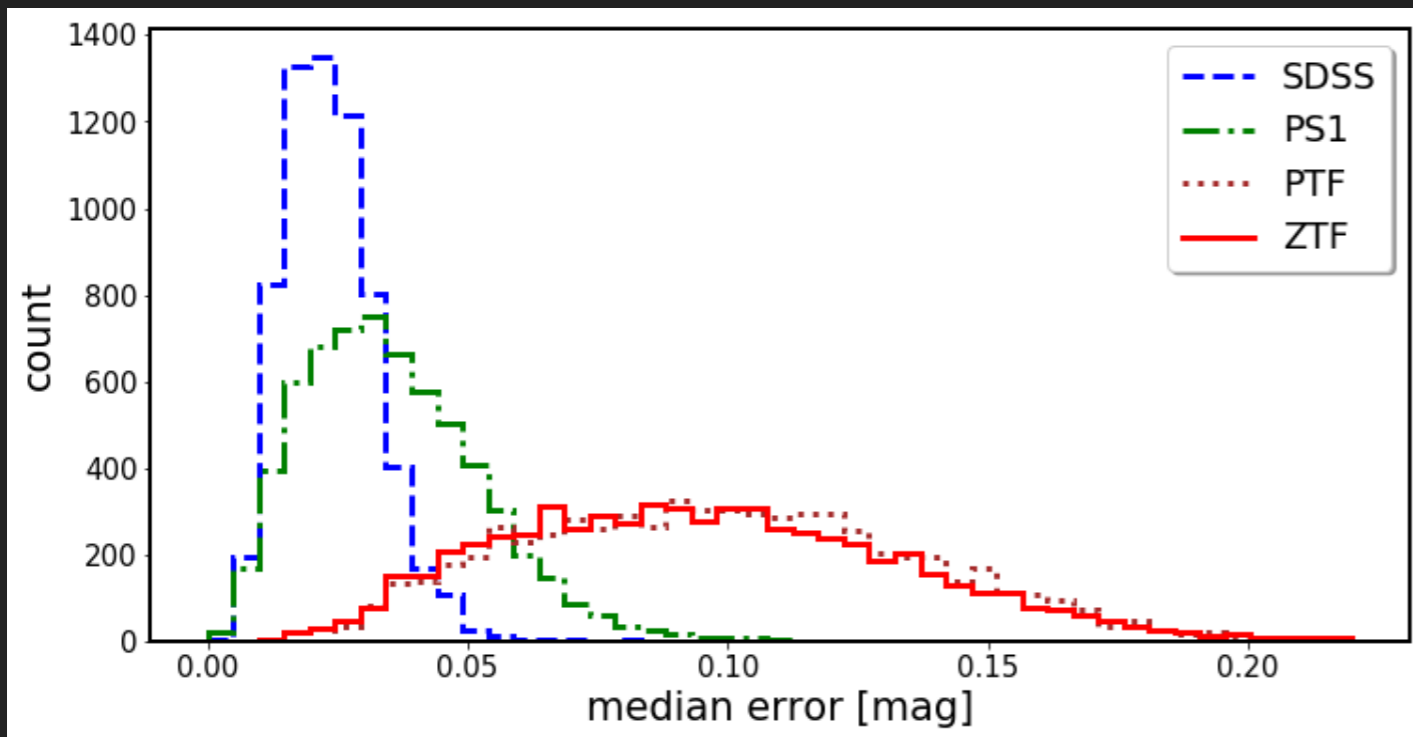
← large $\tau /$
short baseline

→ small $\tau /$
long baseline

EXTENDING LIGHT CURVE BASELINE

- ▶ Use data from a variety of sky surveys - currently available SDSS, PS1, CRTS, ZTF and in the future - **LSST**

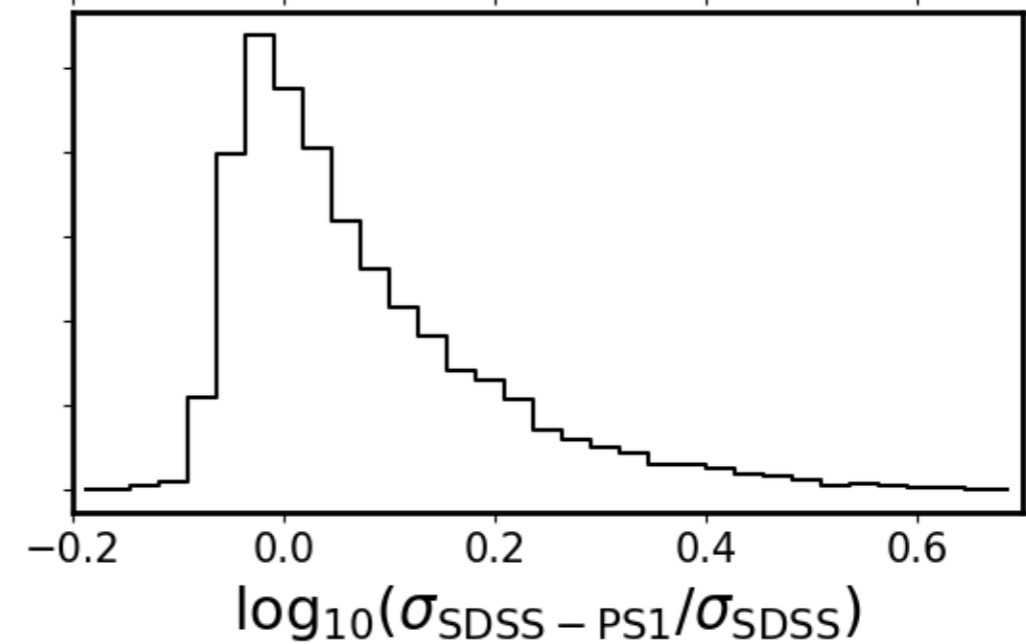
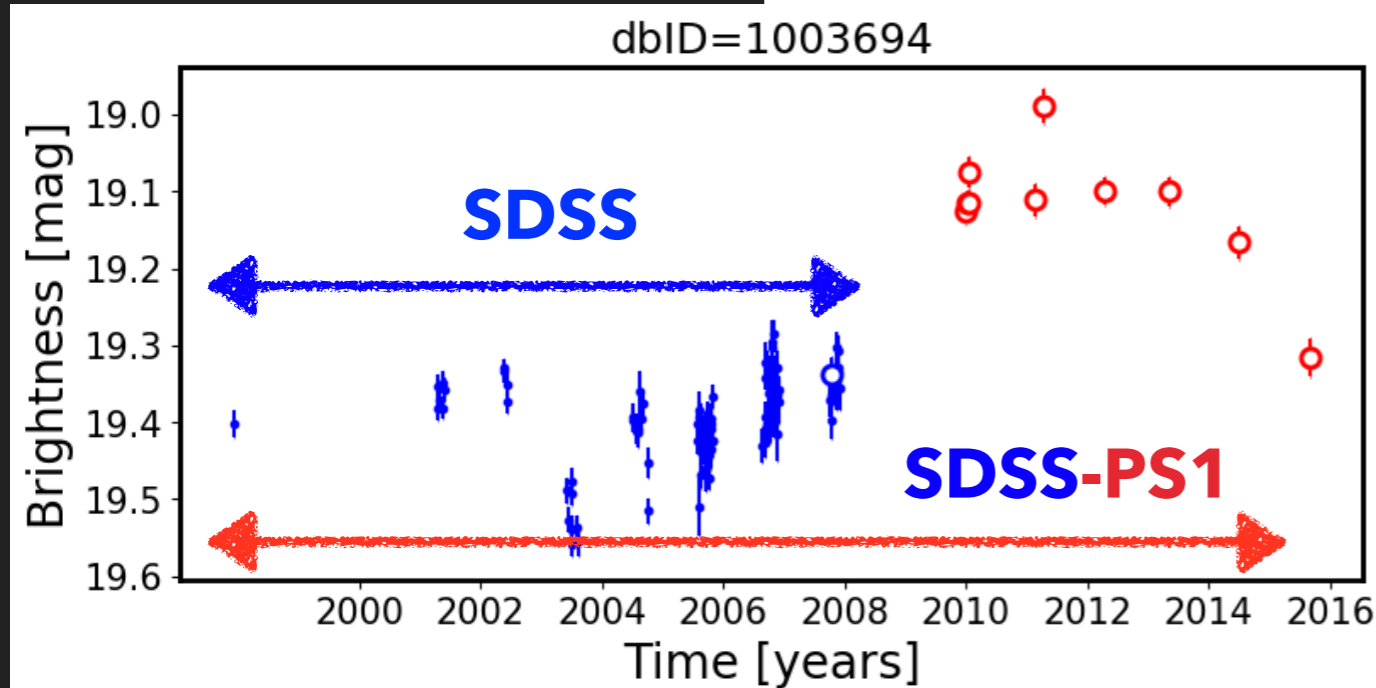
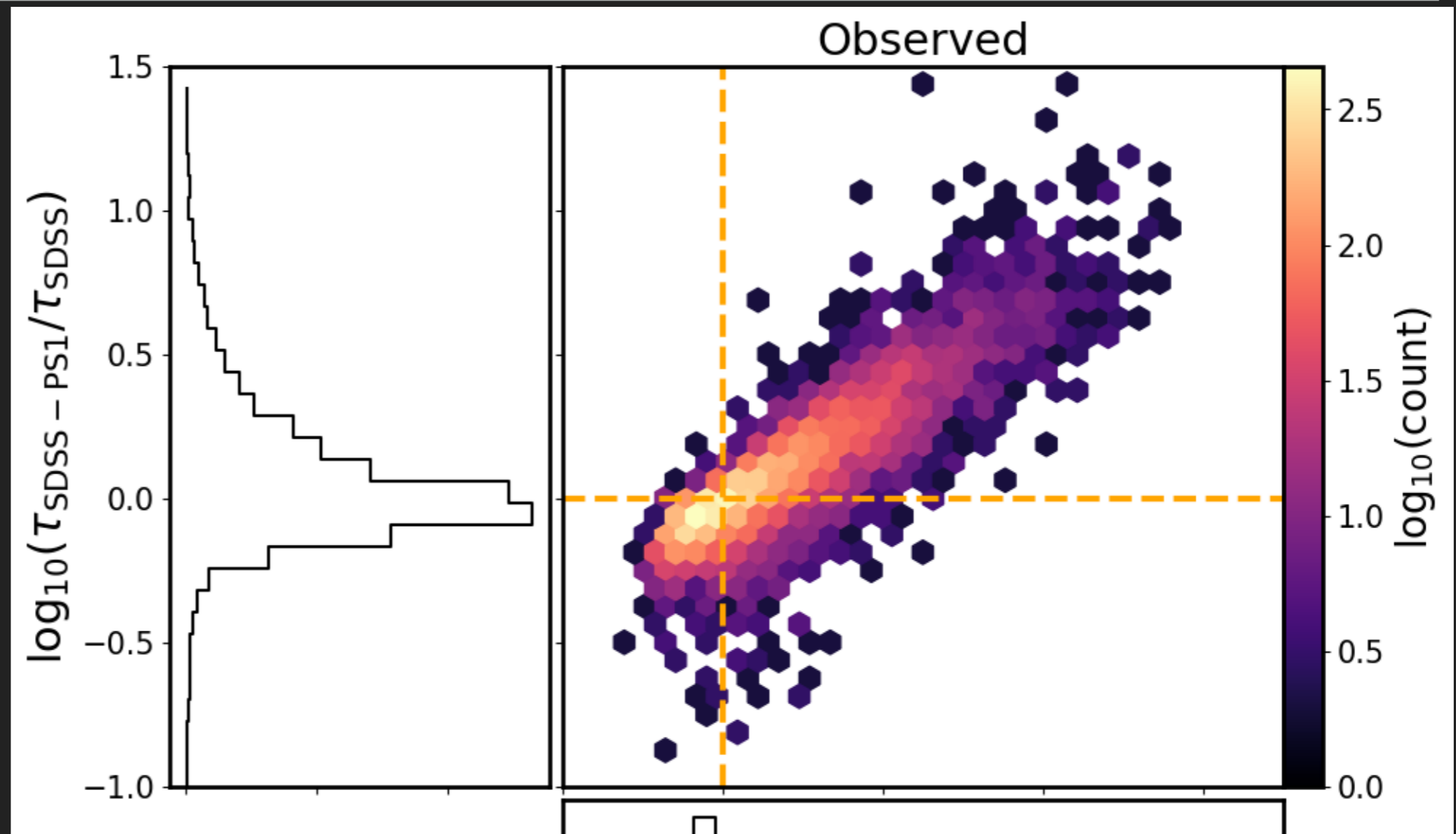




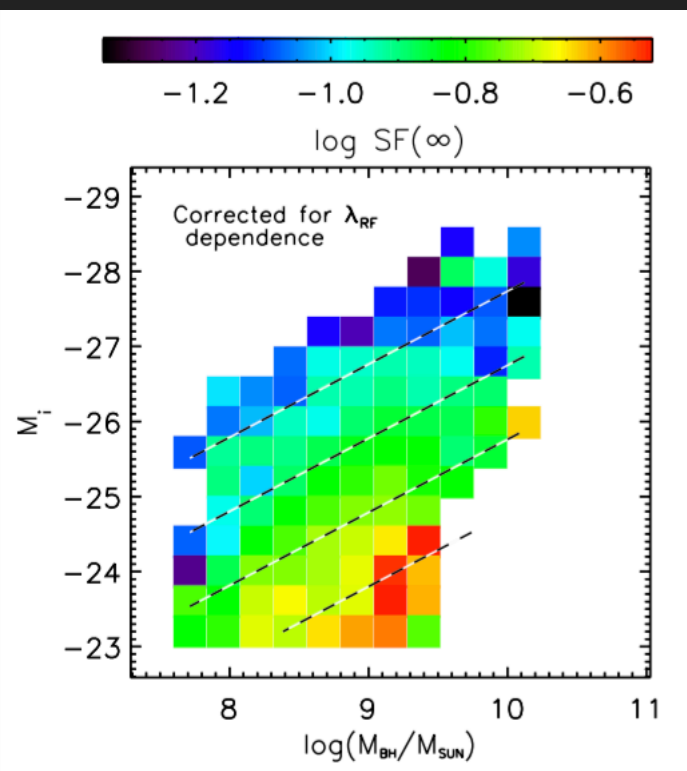
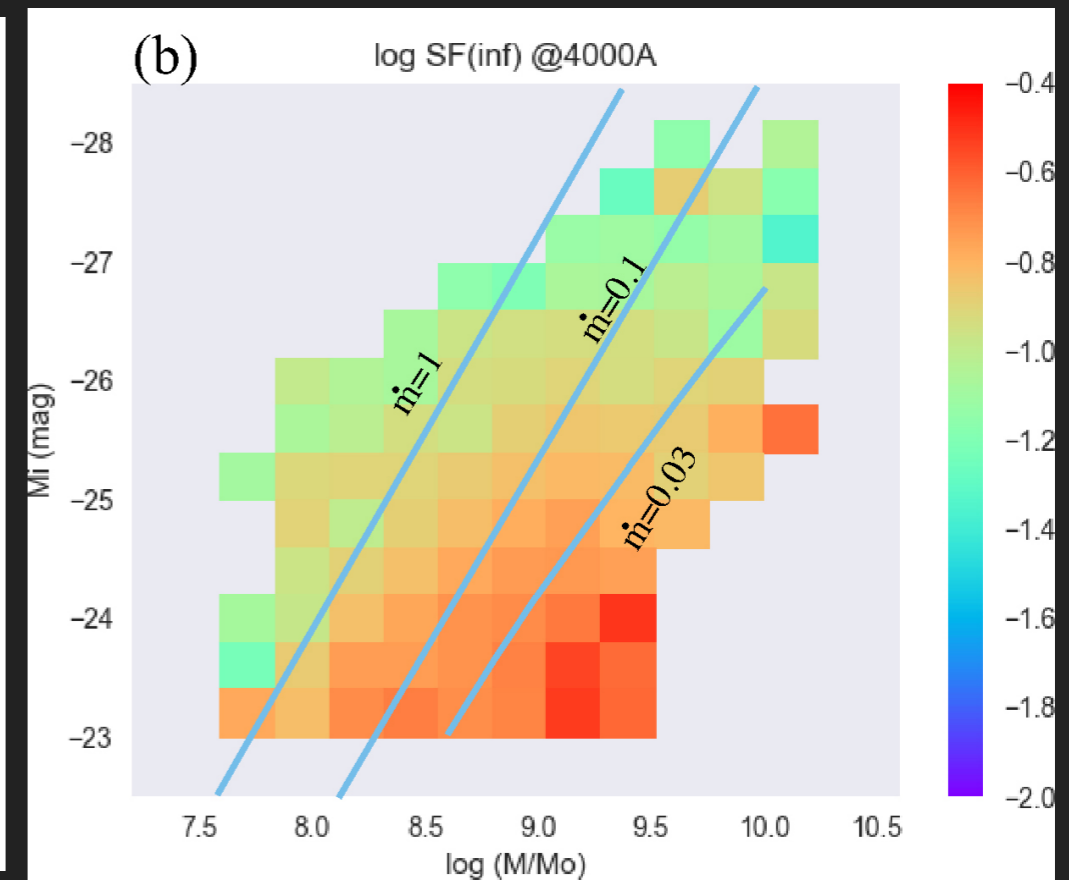
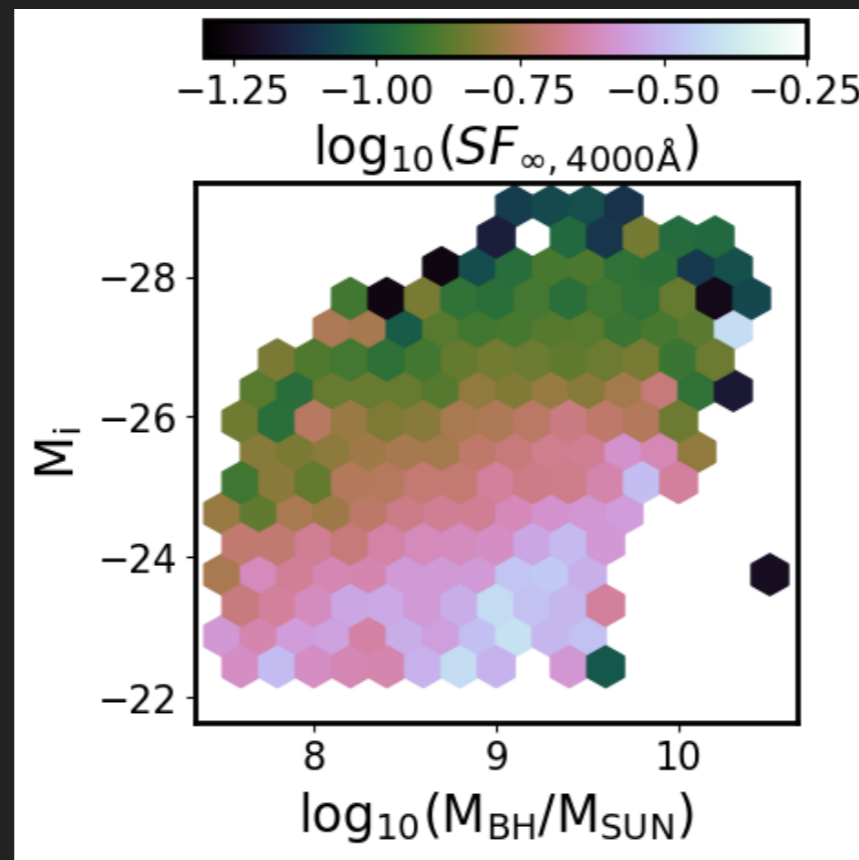
- ▶ Uncertainties are much smaller for SDSS, PS1, because for generally faint sources like quasars, for ZTF and PTF we are reaching all the way to 5σ limit

- ▶ we limit our study to SDSSr- PS1r , without any color offset

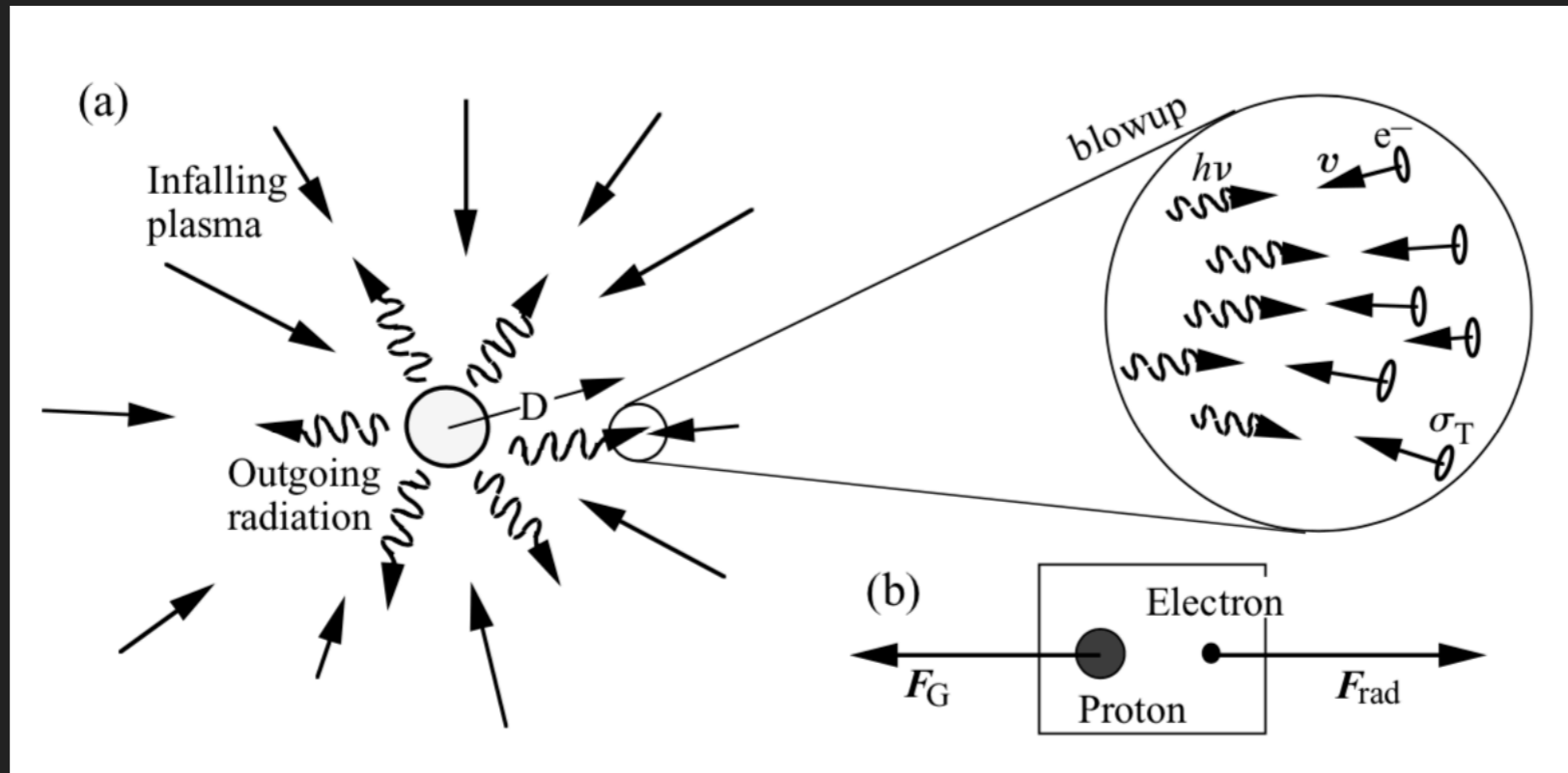
SDSS VS SDSS-PS1 DRW PARAMETERS



VARIABILITY VS BLACK HOLE MASS, LUMINOSITY

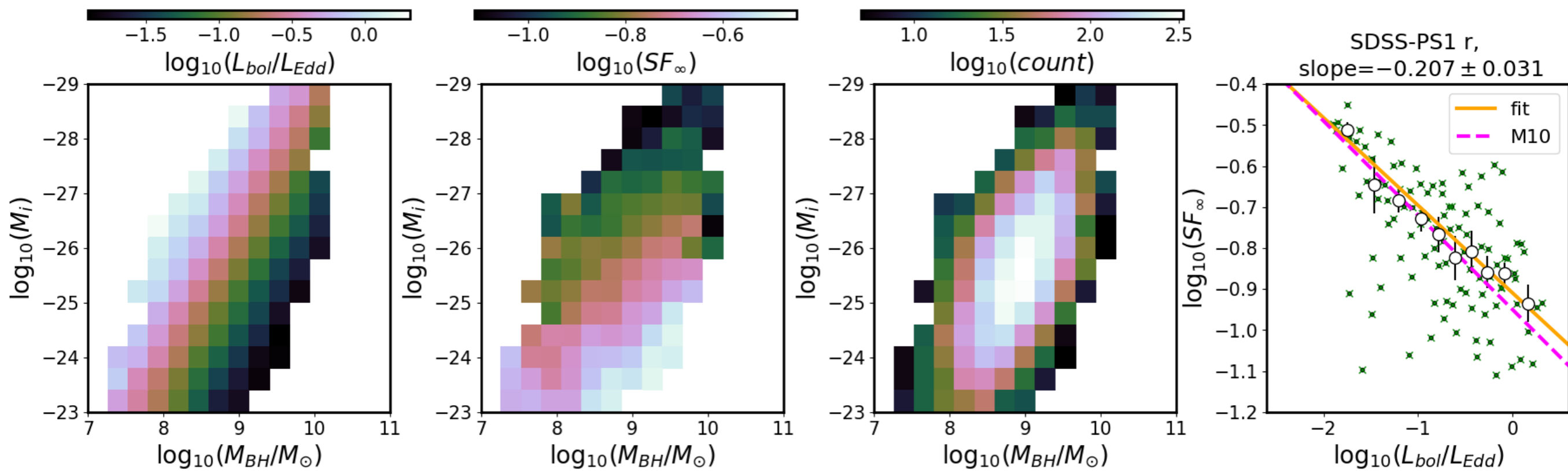


- ▶ the amplitude of variability is anti-correlated with bolometric luminosity, can be linked to eg. accretion rate



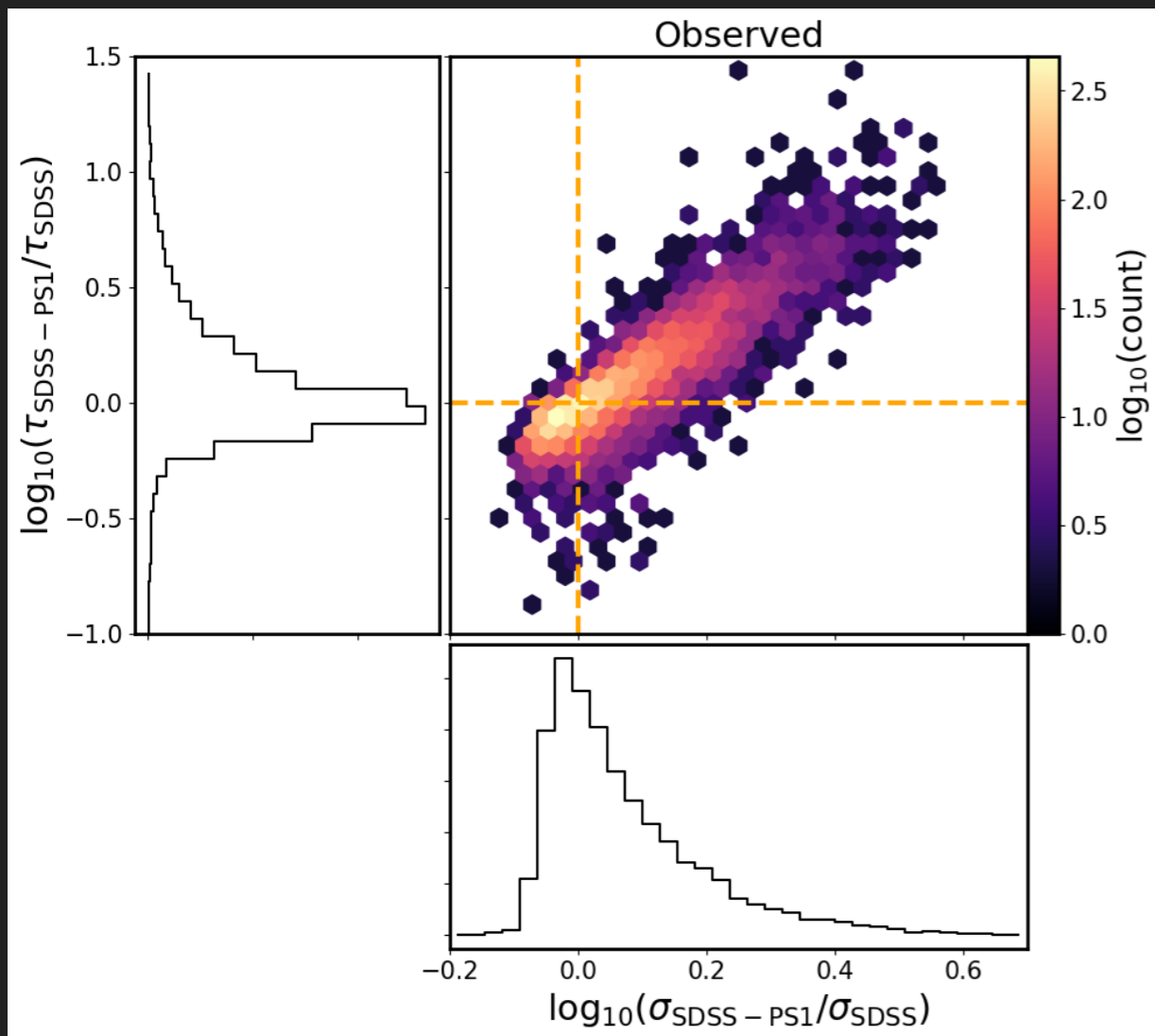
$$f_{Edd} = \frac{L_{Bol}}{L_{Edd}} \sim \frac{L_{Bol}}{M_{BH}}$$

$$L_{Edd} = 1.26 \cdot 10^{38} M_{BH} \text{ erg s}^{-1}$$

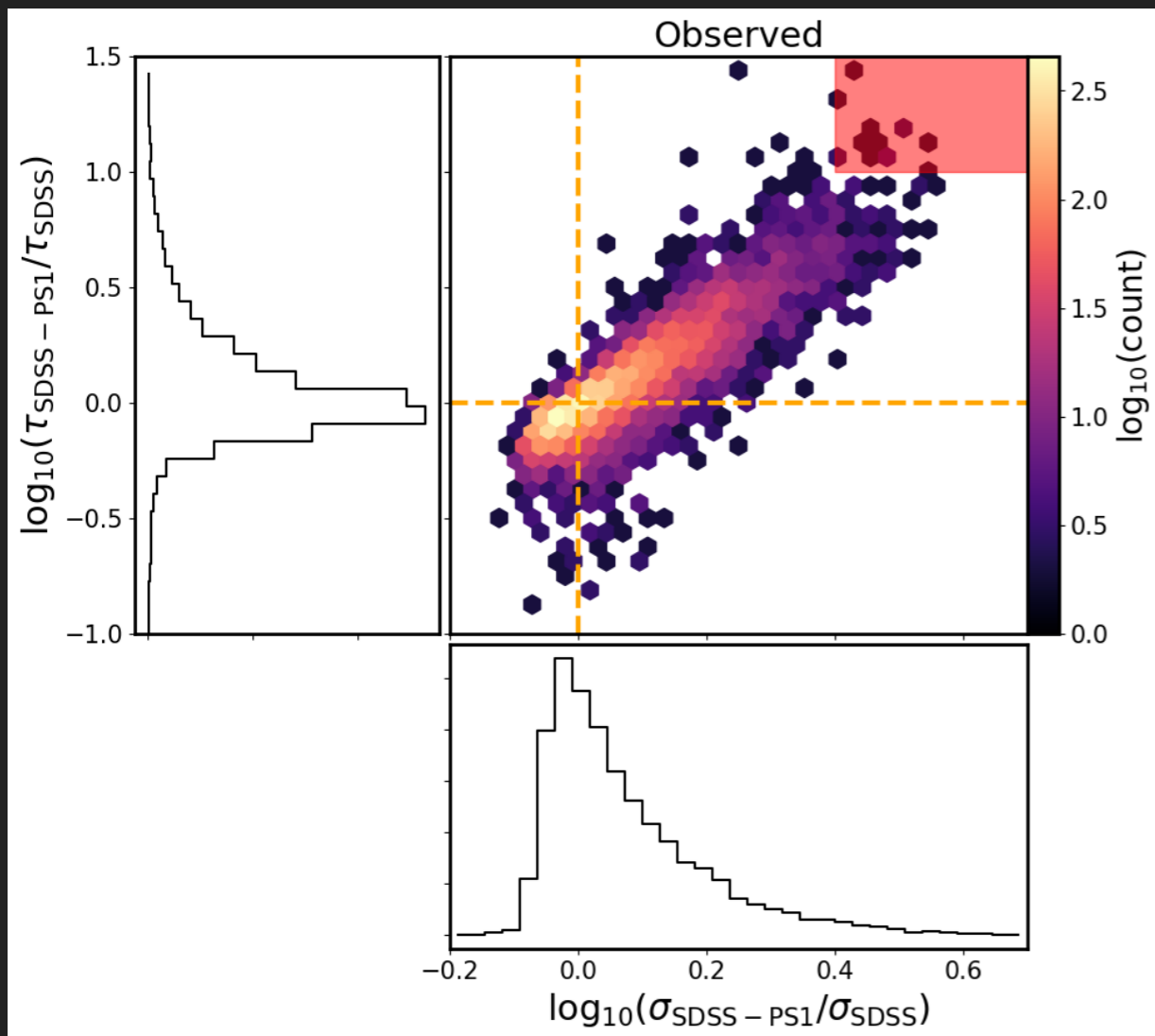


- ▶ lower Eddington ratio - dwindling fuel supply & larger variability

$$f_{Edd} = \frac{L_{Bol}}{L_{Edd}} \sim \frac{L_{Bol}}{M_{BH}}$$

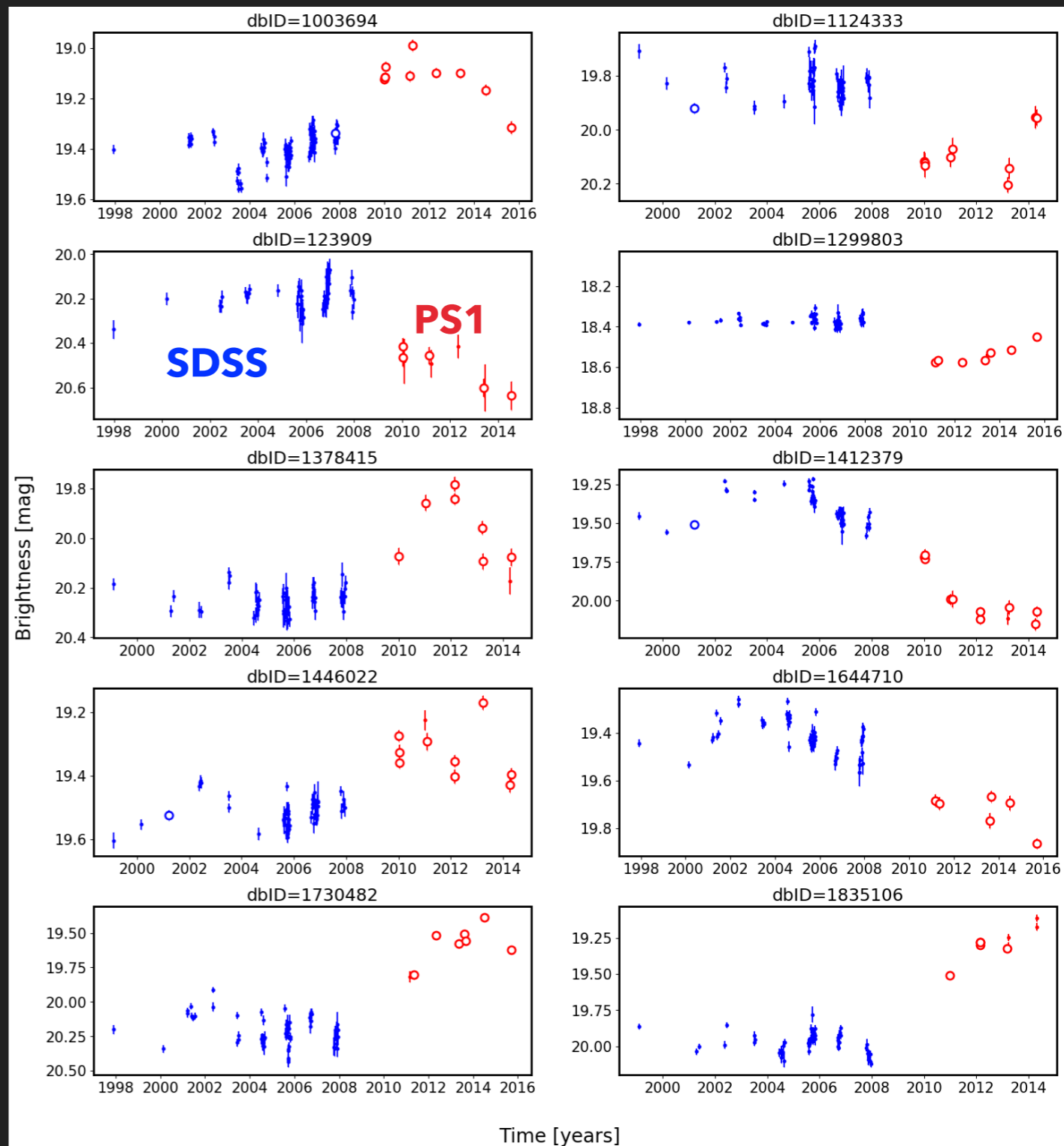
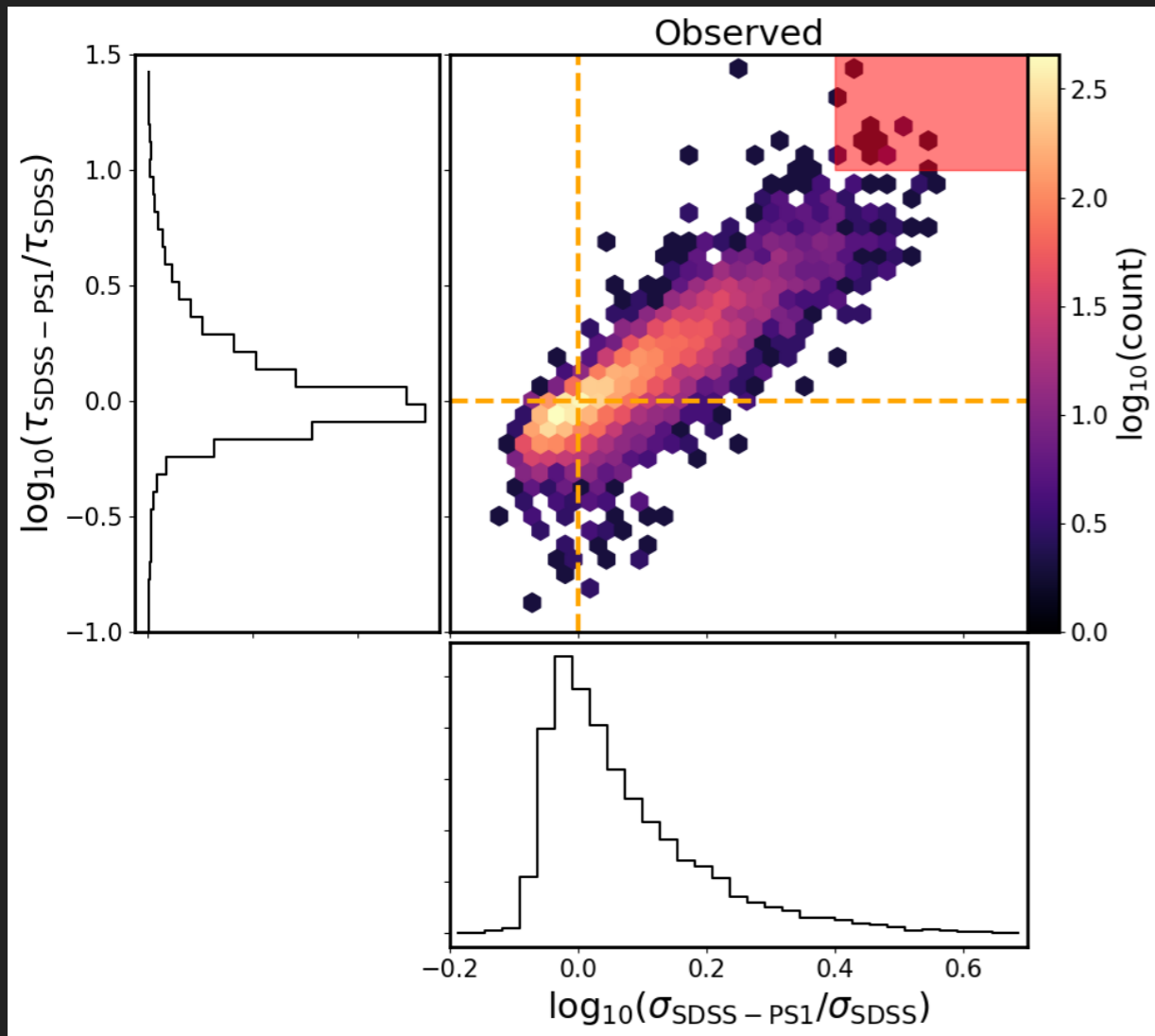


- ▶ compare DRW parameters retrieved using SDSS vs SDSS+PS1 data



- ▶ compare DRW parameters retrieved using SDSS vs SDSS+PS1 data

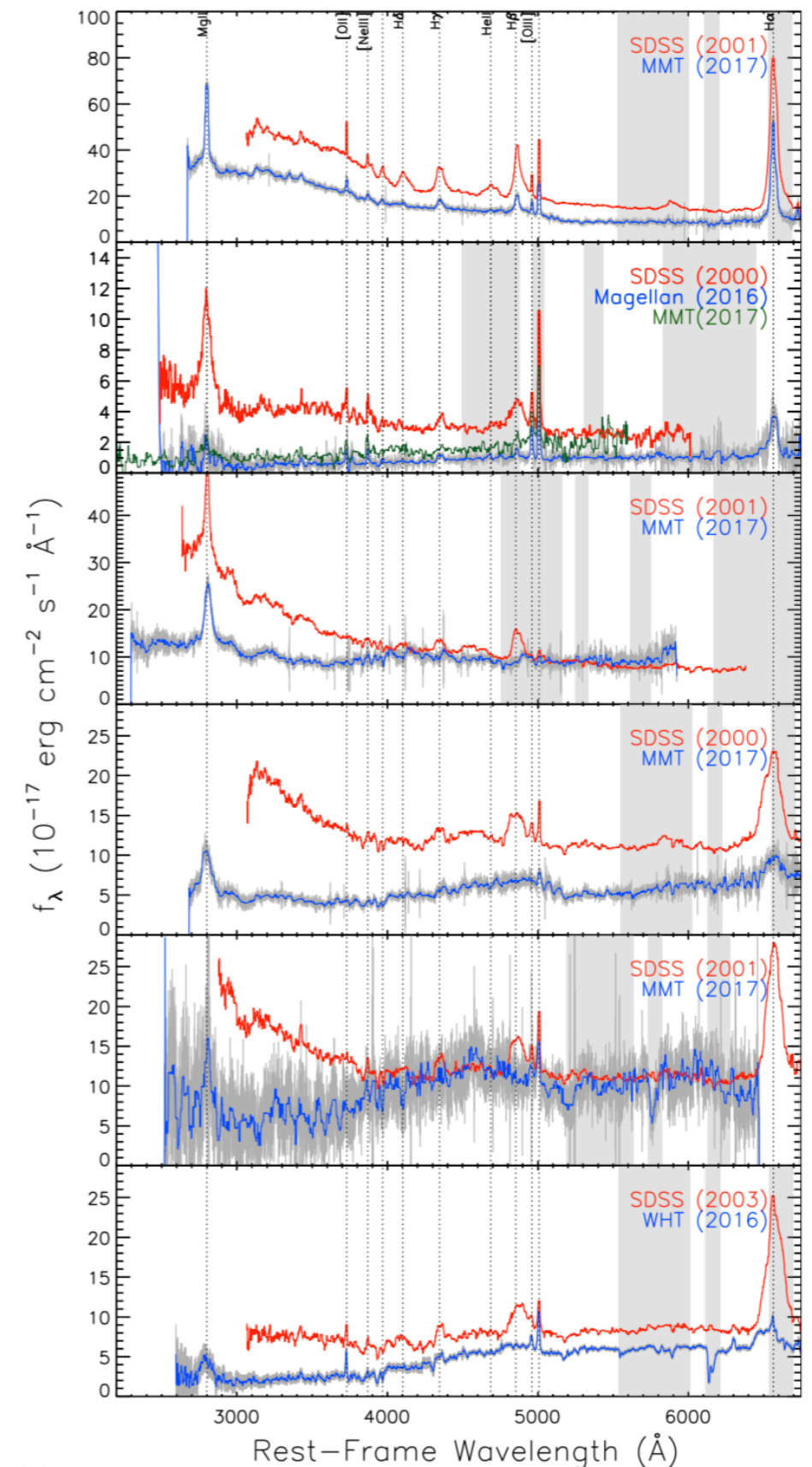
RESULTS: OUTLIERS ARE INTERESTING

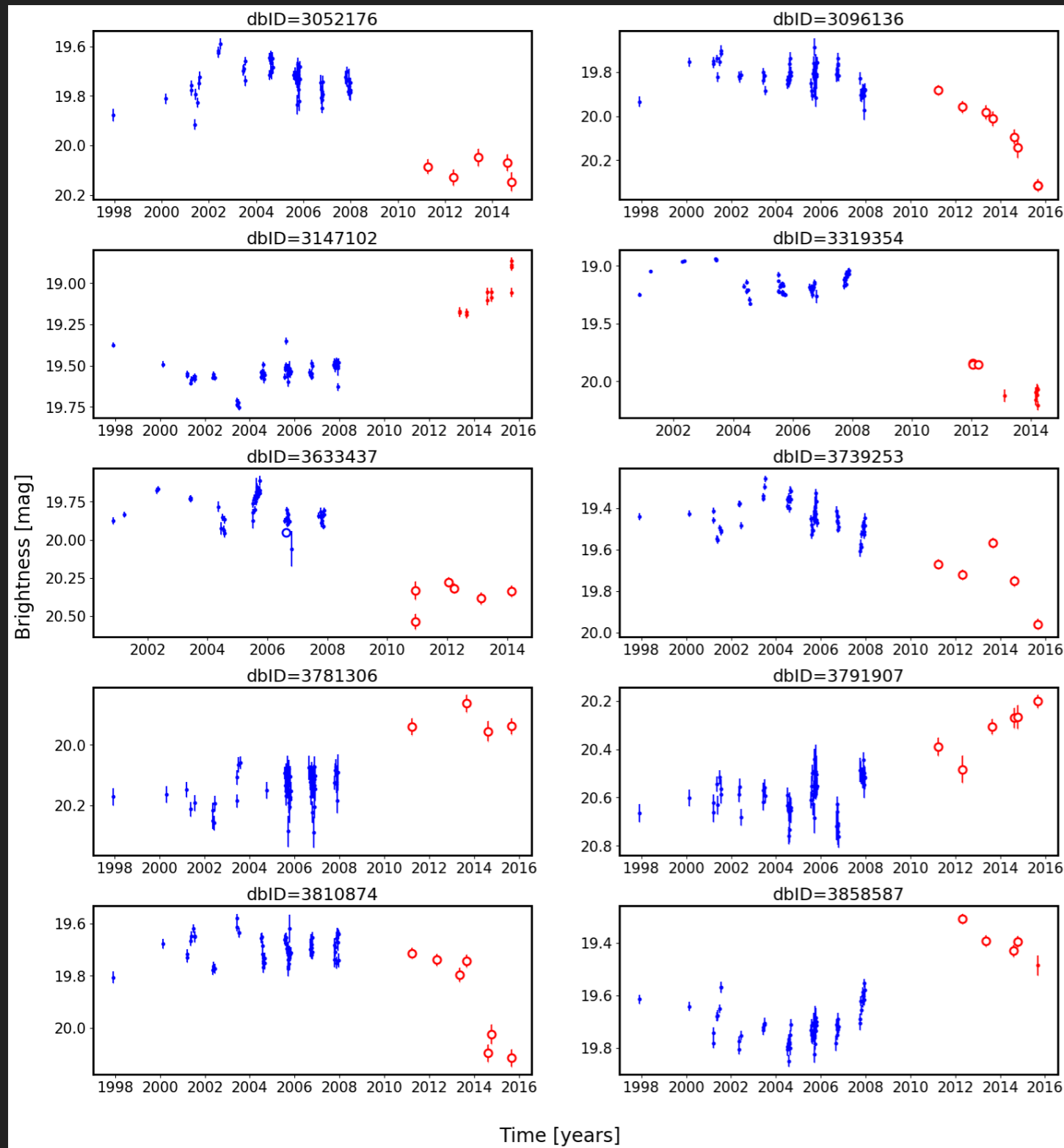


- ▶ compare DRW parameters retrieved using SDSS vs SDSS+PS1 data

Changing-Look phenomenon corresponds to the (dis)-appearance of broad emission lines and a non-stellar continuum, changing eg. between type 1.8-2 (narrow-line) to type 1 (broad-line) AGN (or vice versa) on a timescale of years.

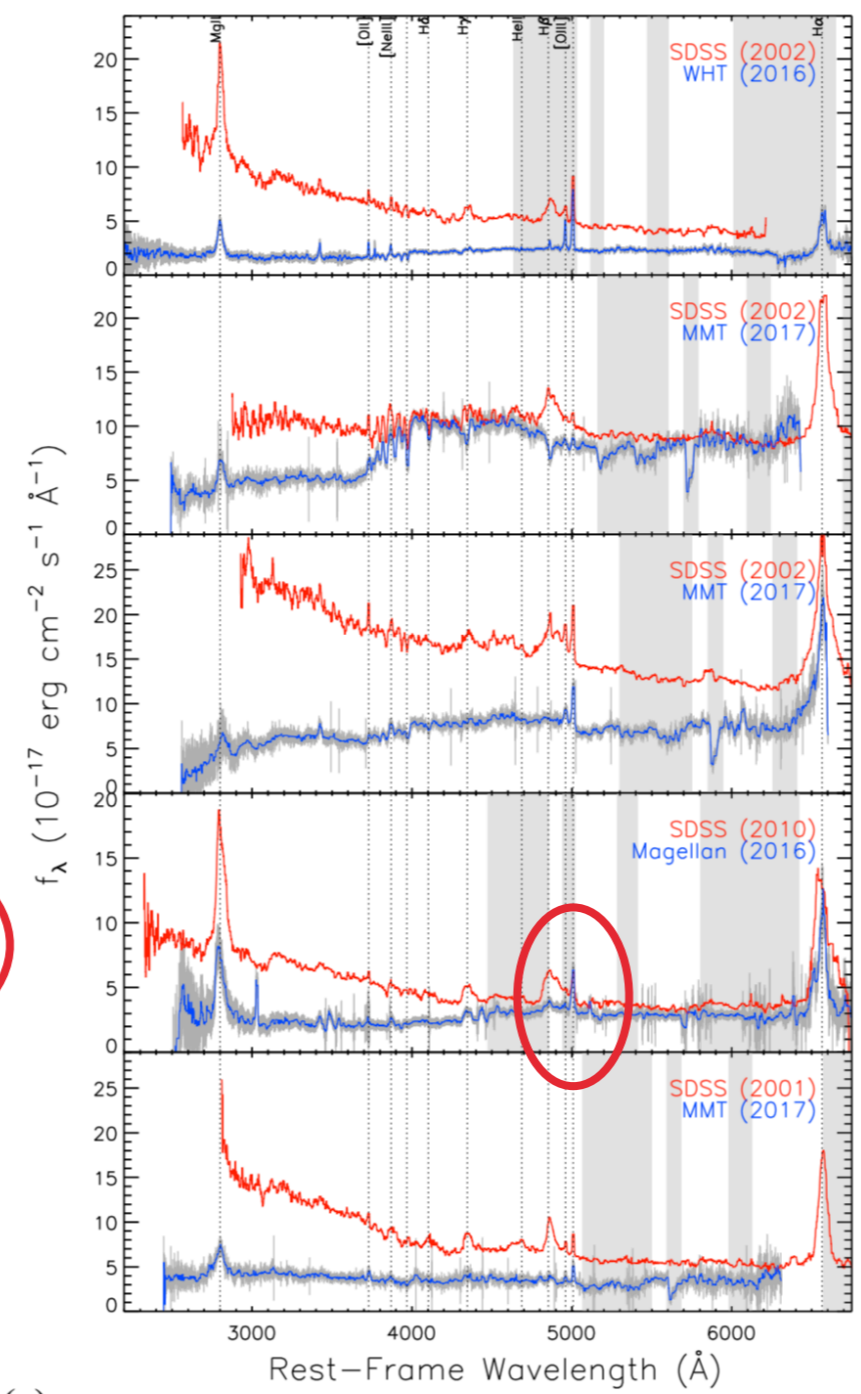
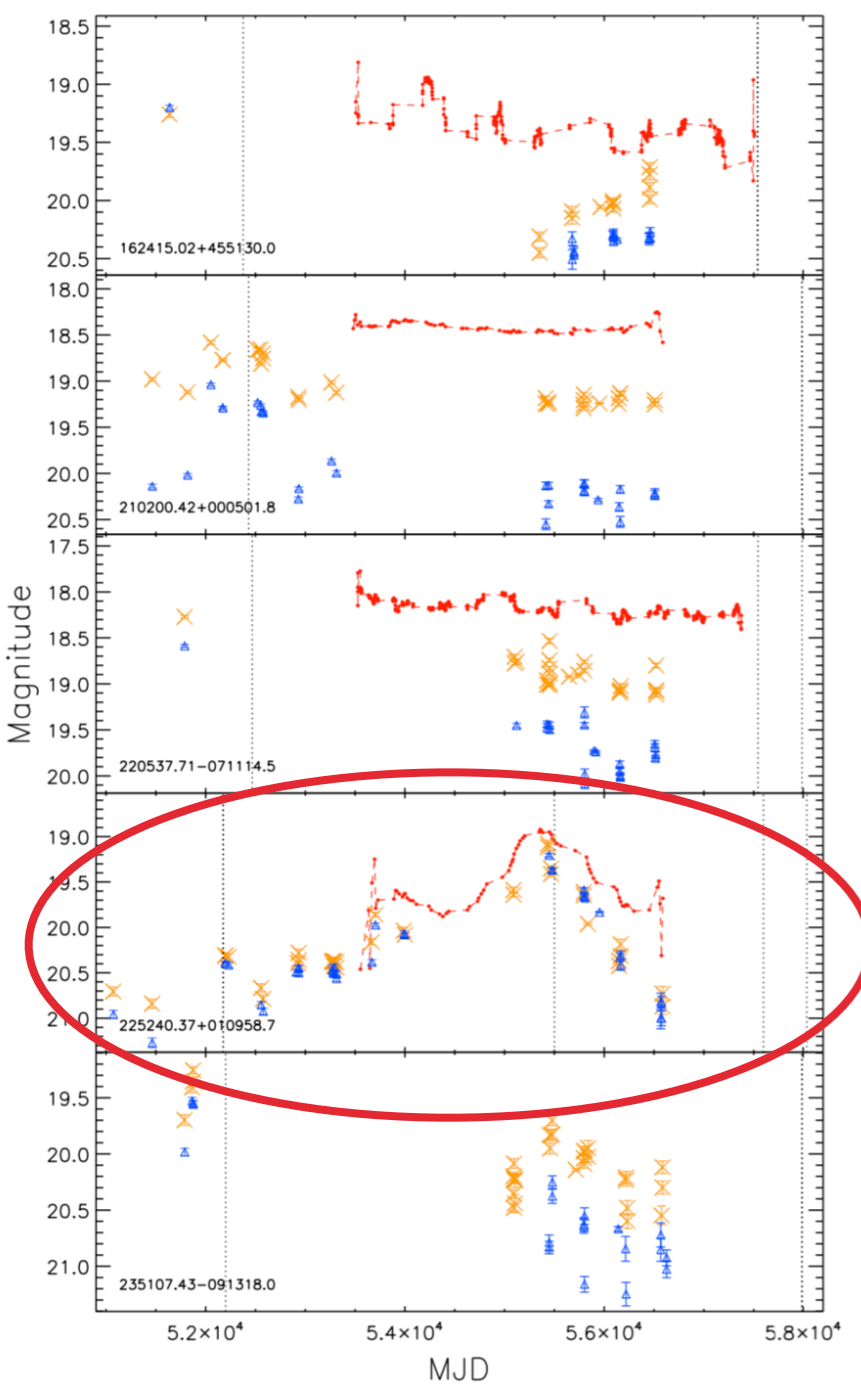
This may mean that in a dim state we may be able to see more clearly the host galaxy contribution, without the contamination of AGN continuum.



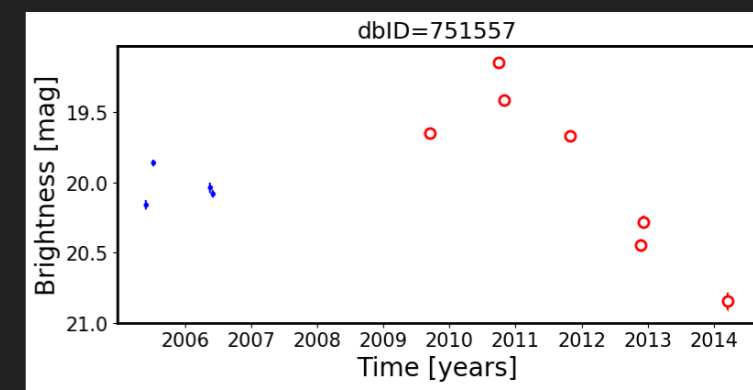


- ▶ CLQs are found near the critical luminosity below which the BLR disappears
- ▶ CLQs have lower Eddington ratios than a control sample matched in redshift and luminosity
- ▶ CLQs are probably the tail end of a continuous distribution of QSO variability (MacLeod+2019)

CONFIRMED CLQSO CANDIDATE



one of our candidates:
SDSSJID
225240.37+010958.7



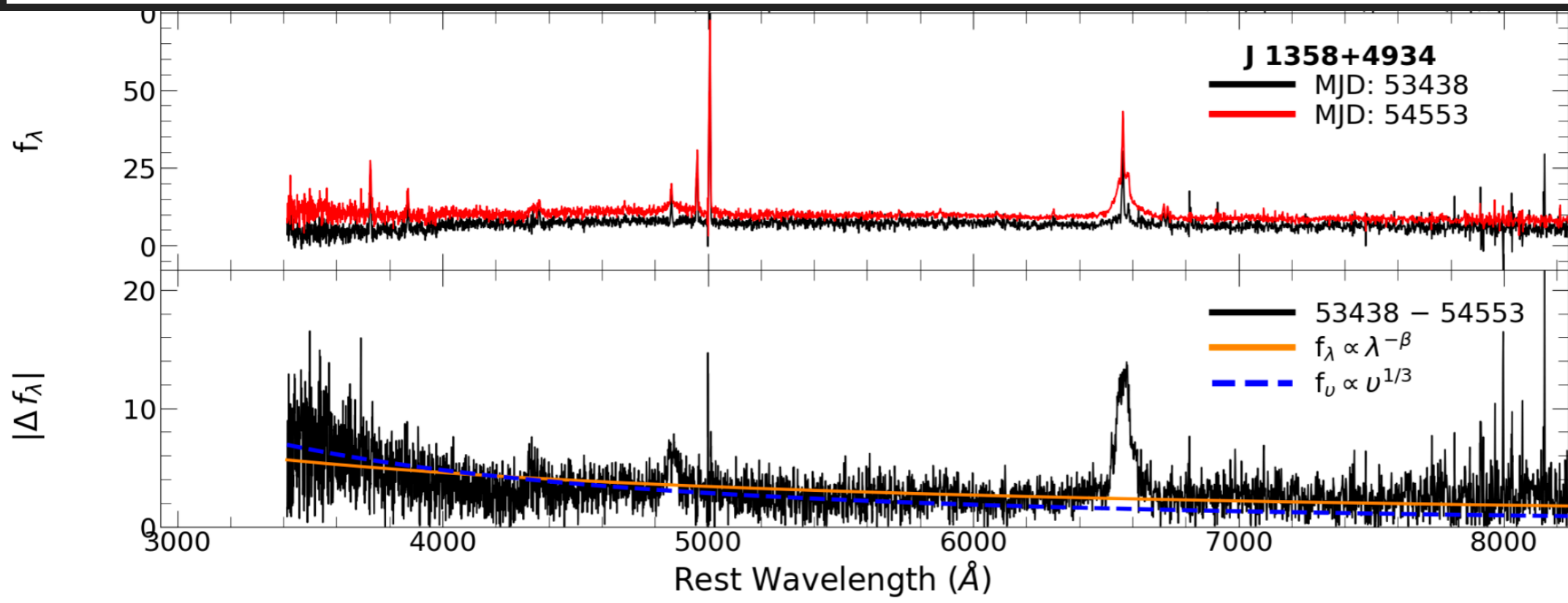
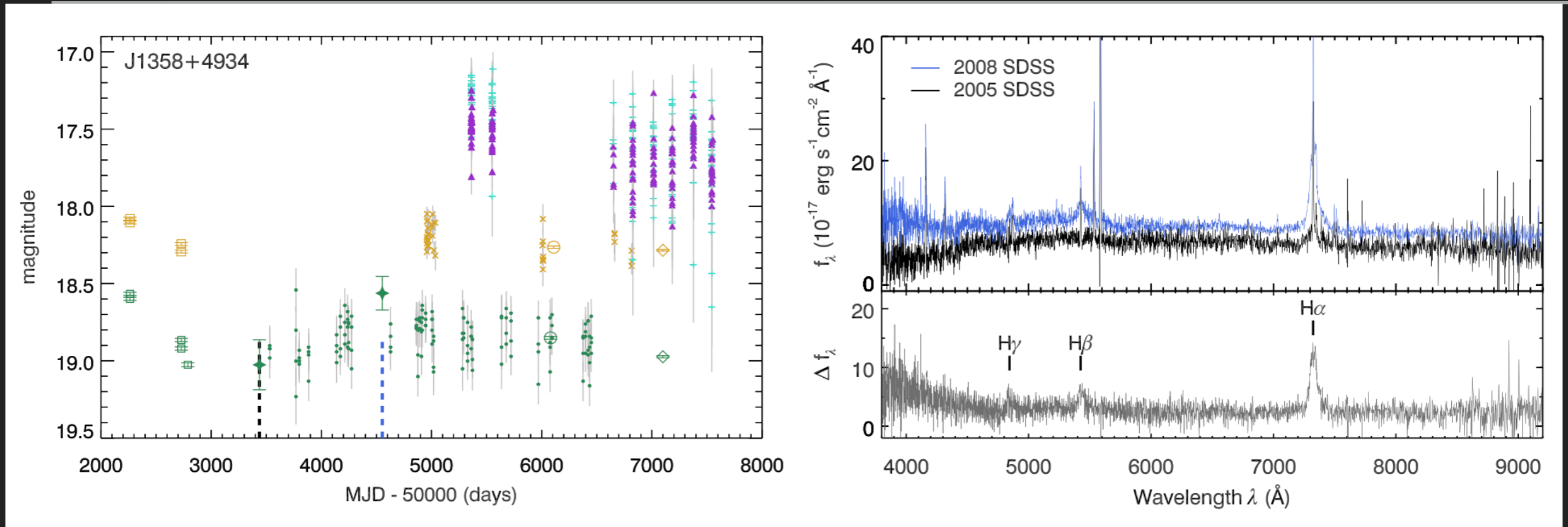
(c)
Figure 2. (Continued.)



SDSS 2.5m

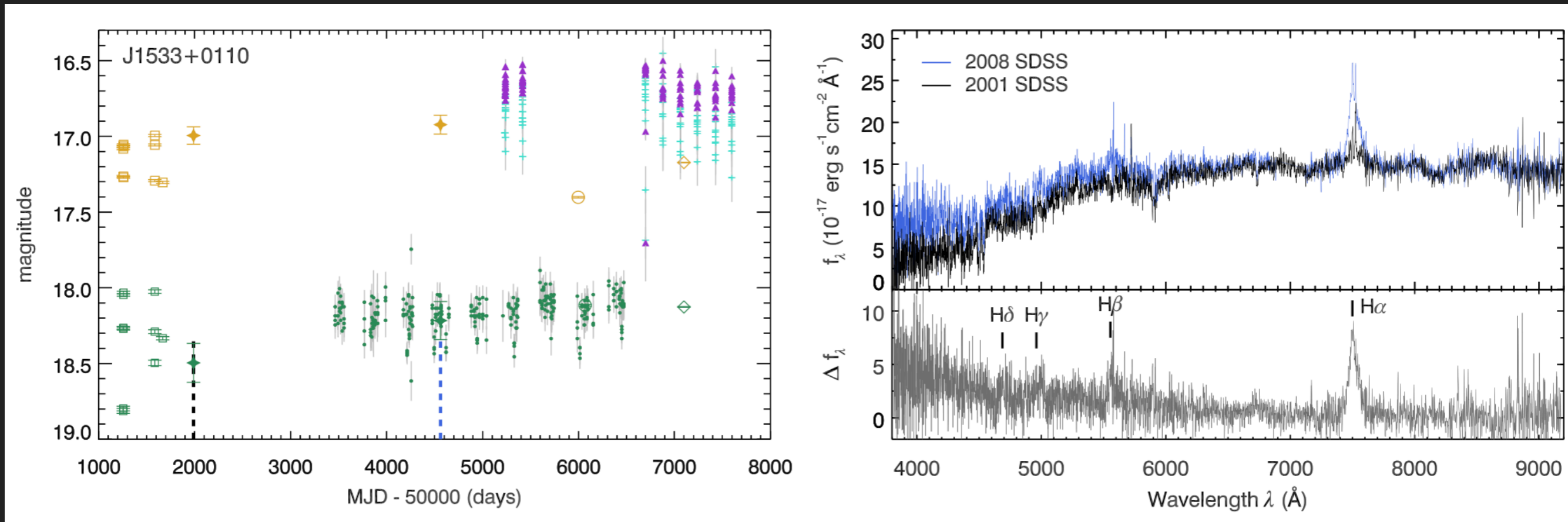
Apache Point
Observatory, 3.5m

SPECTROSCOPY: J135855, TURN-ON



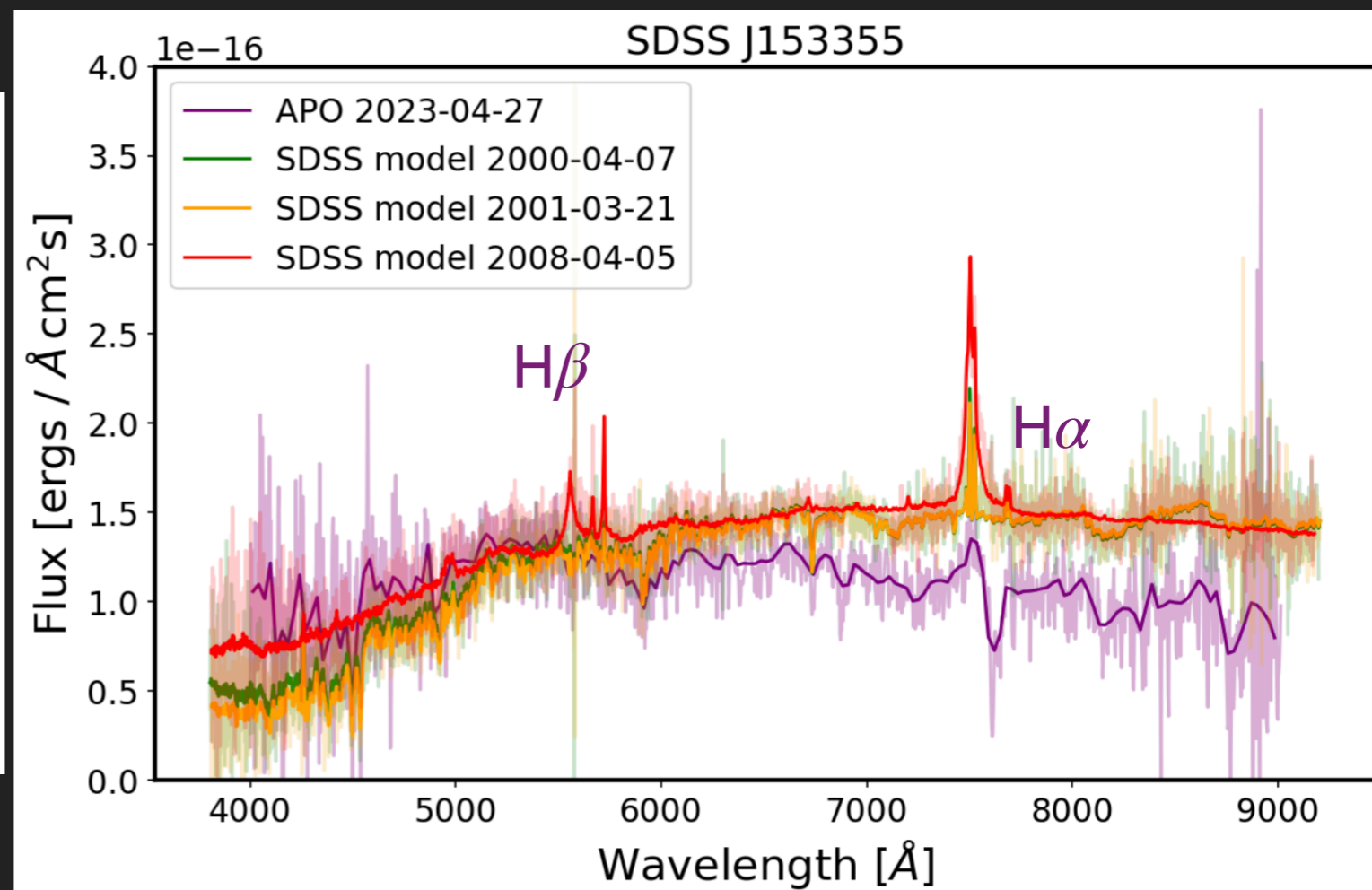
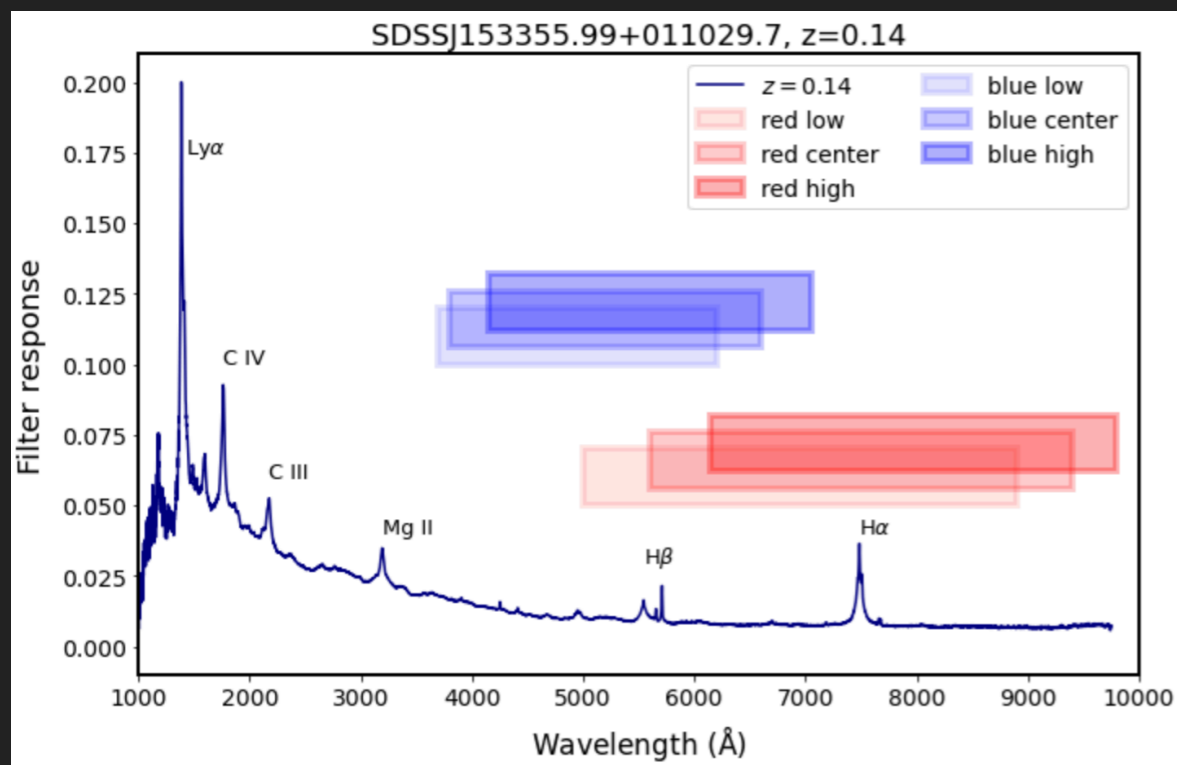
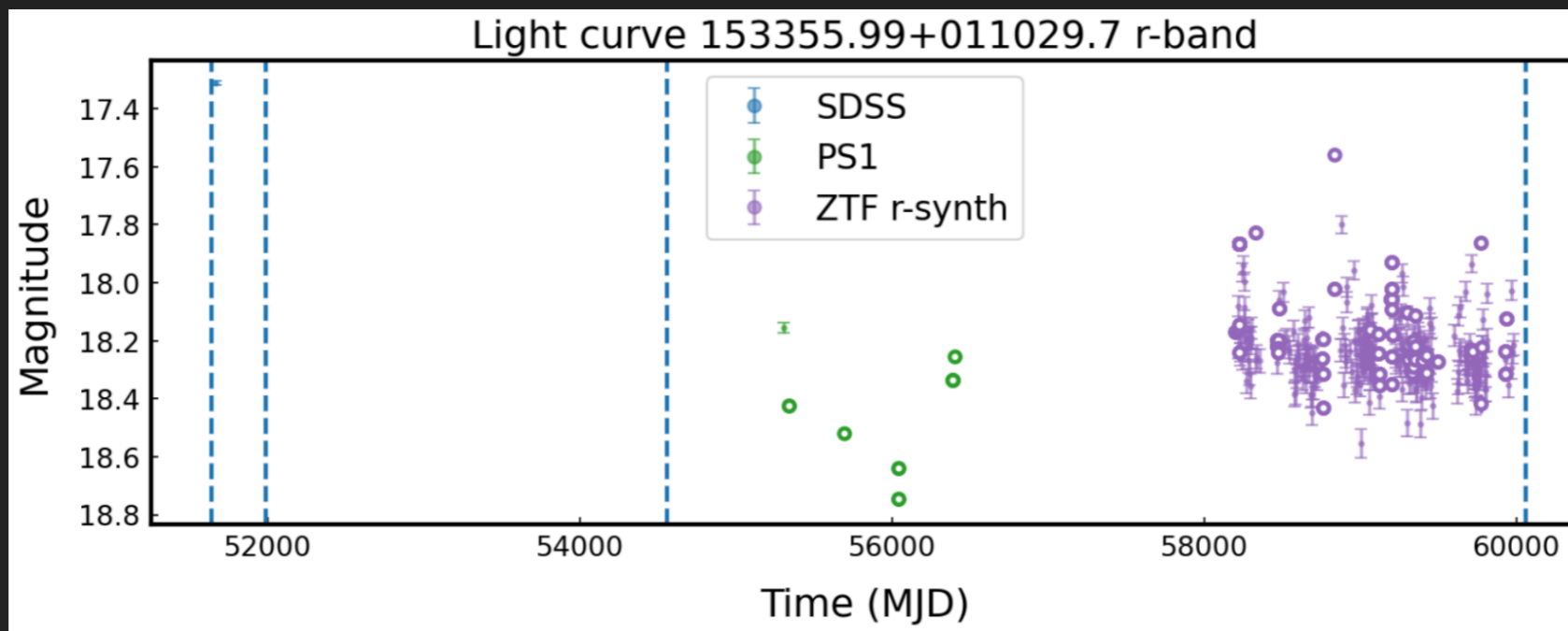
Yang+2018, Fig.5

 $z=0.11592$

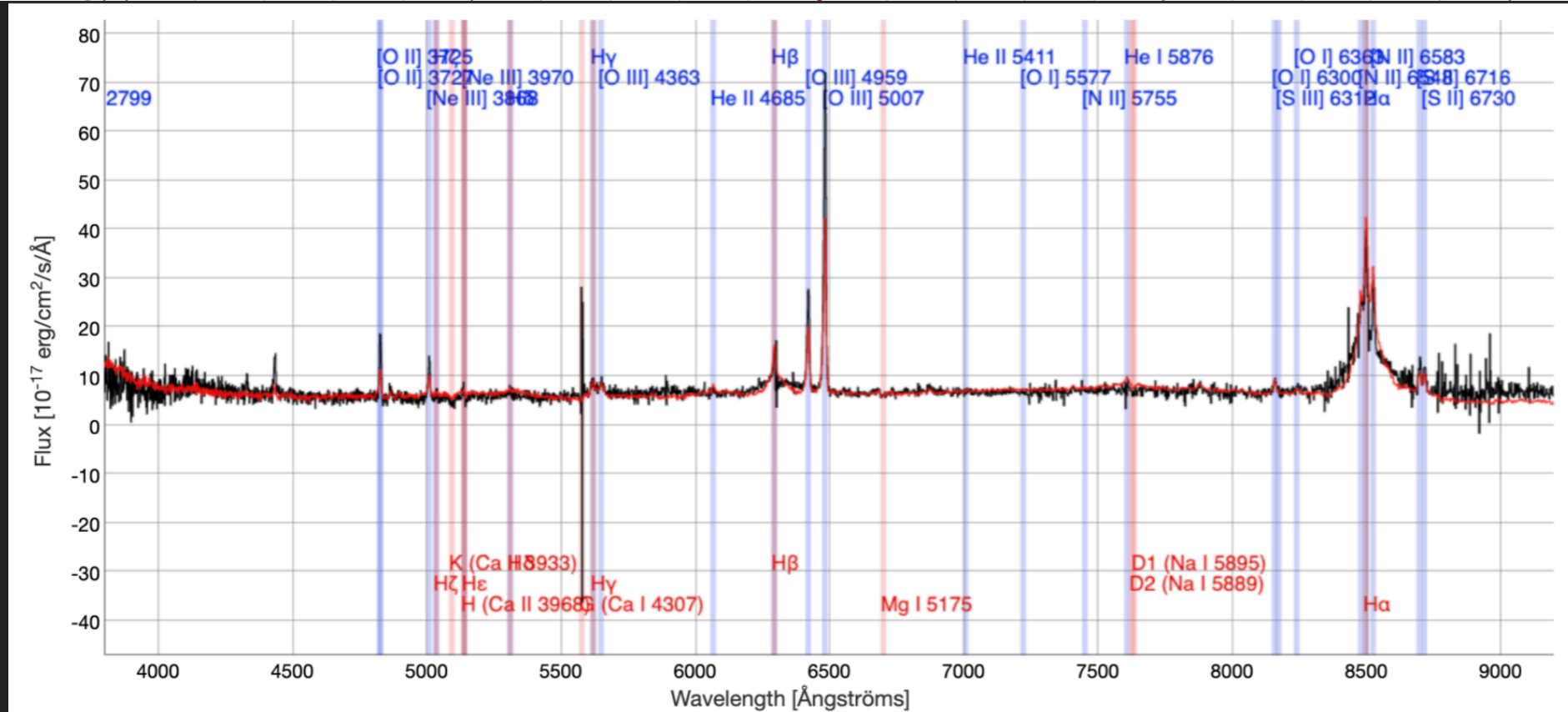
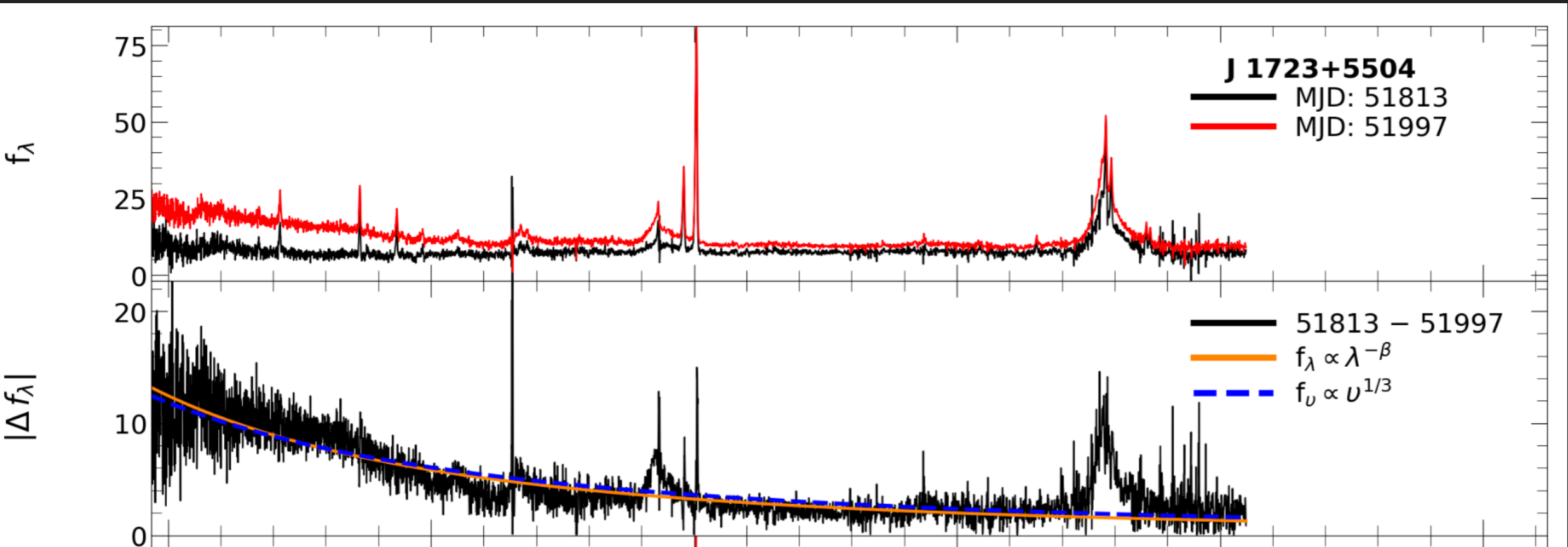


Yang+2018, Fig.5
z=0.1426

FOLLOW-UP SPECTROSCOPY 153355 TURN-ON (?)



FOLLOW-UP SPECTROSCOPY 172322 (TURN-ON)

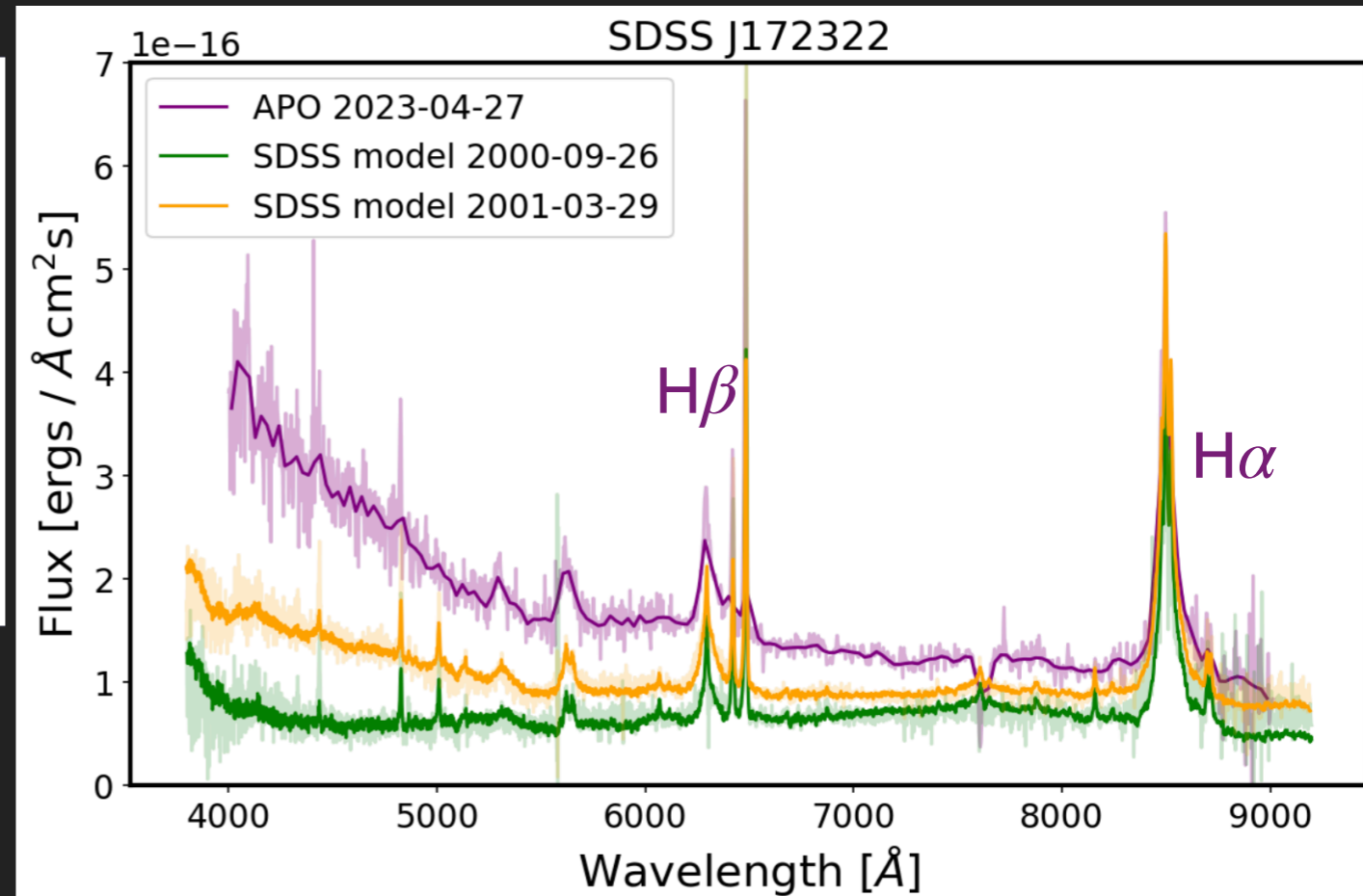
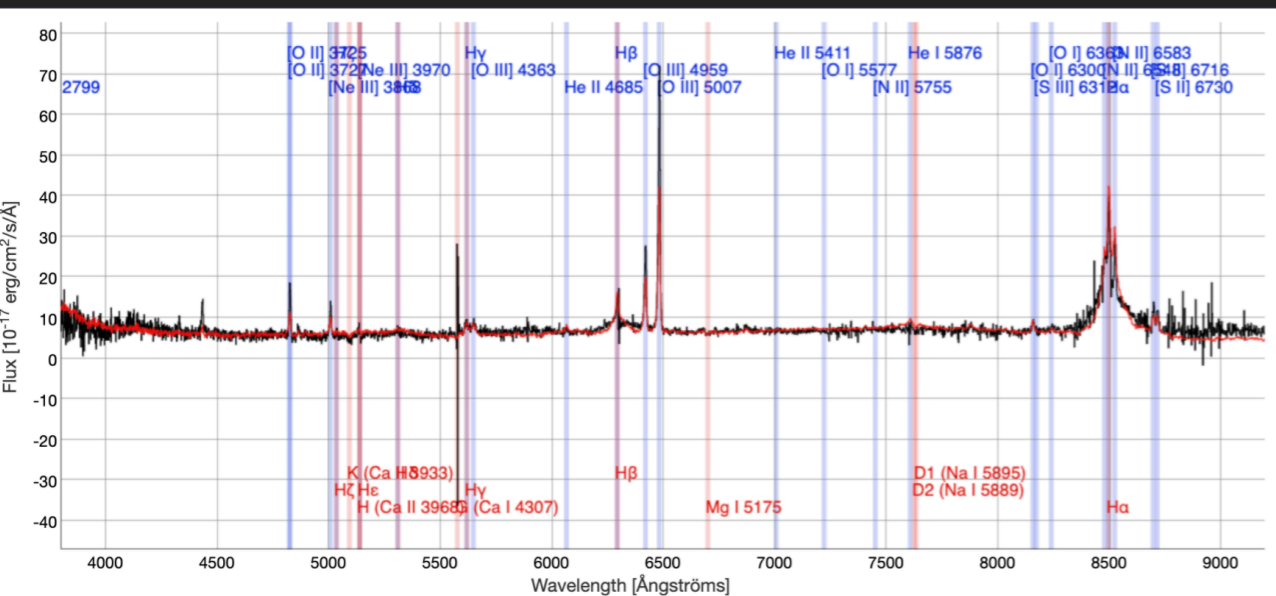
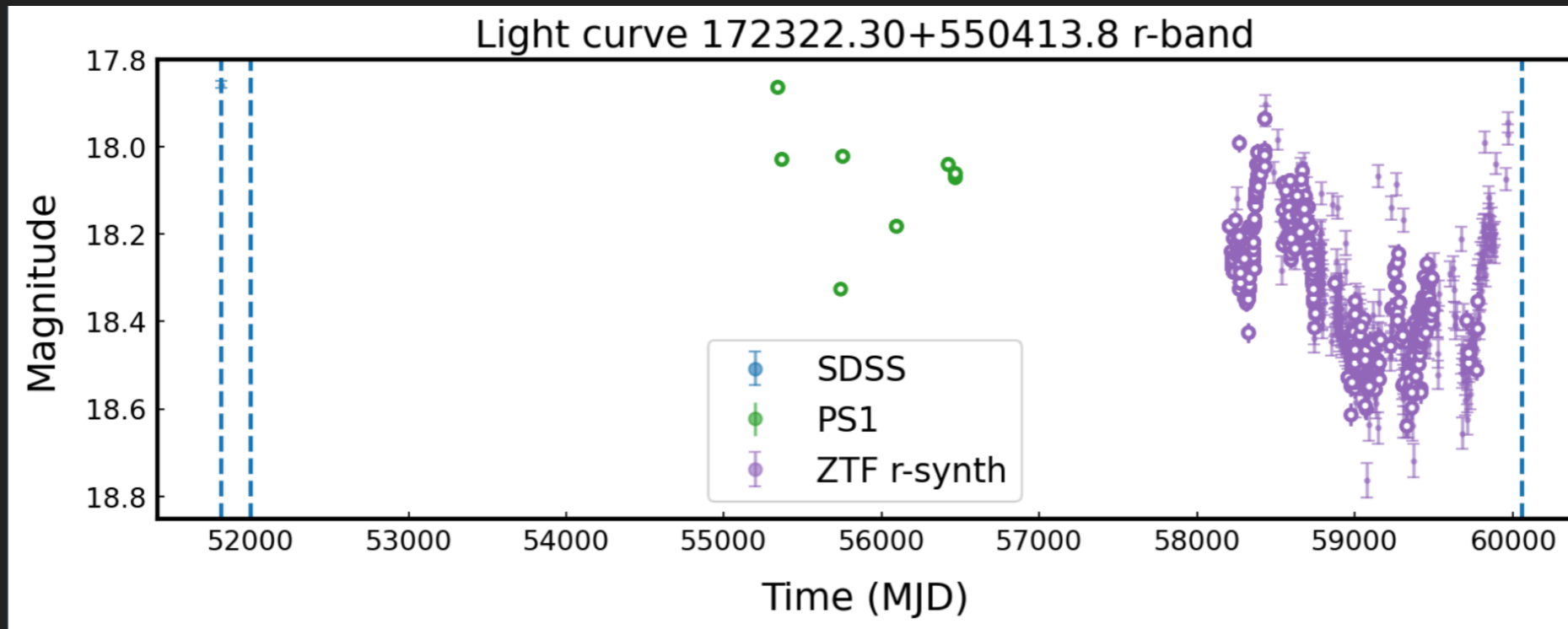


Potts-Villforth+2021, Fig.2

172322 transitioned from AGN type 1.83 to type 1 in just 184 days (142 in rest frame).

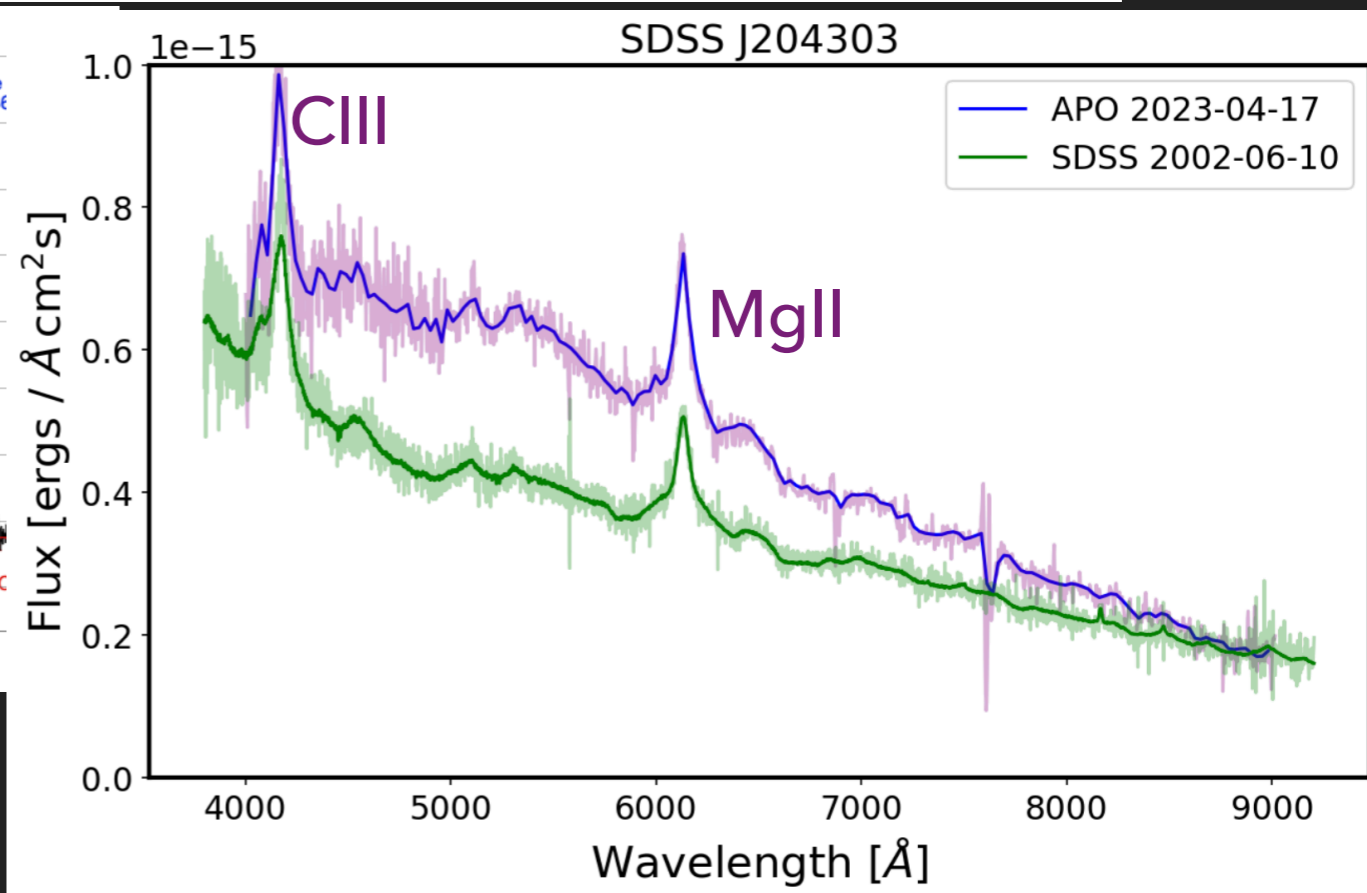
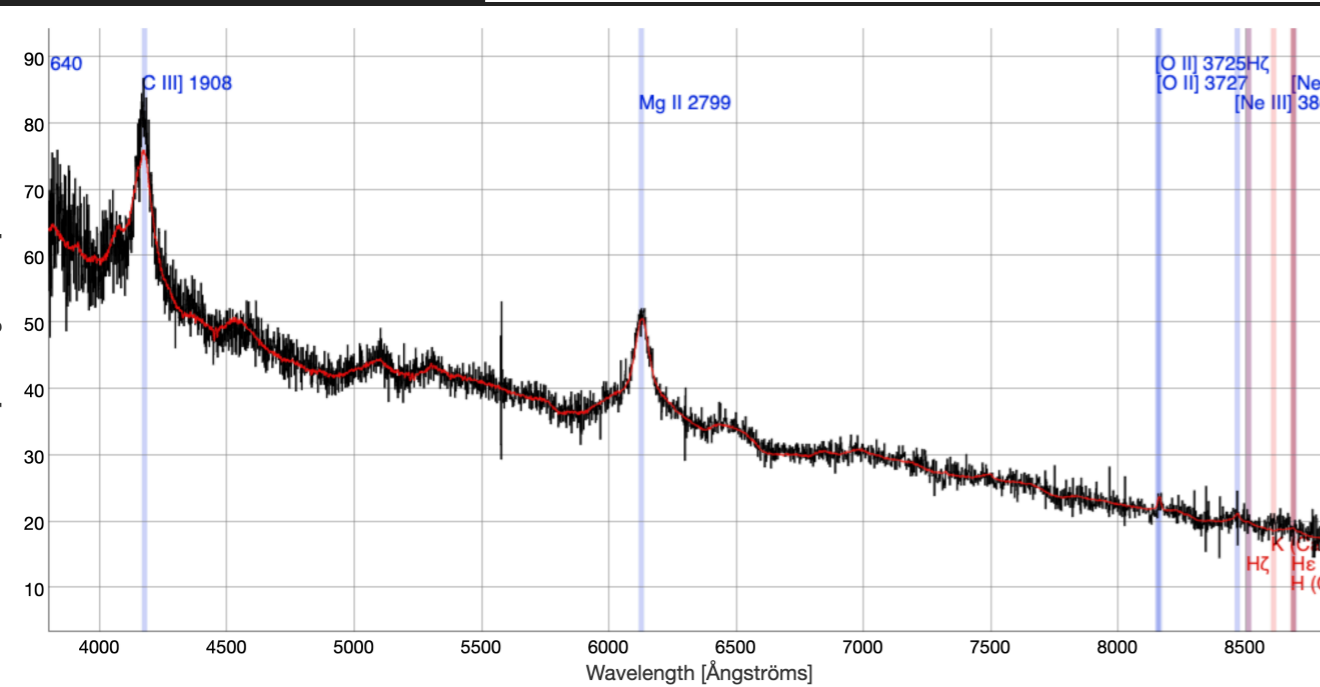
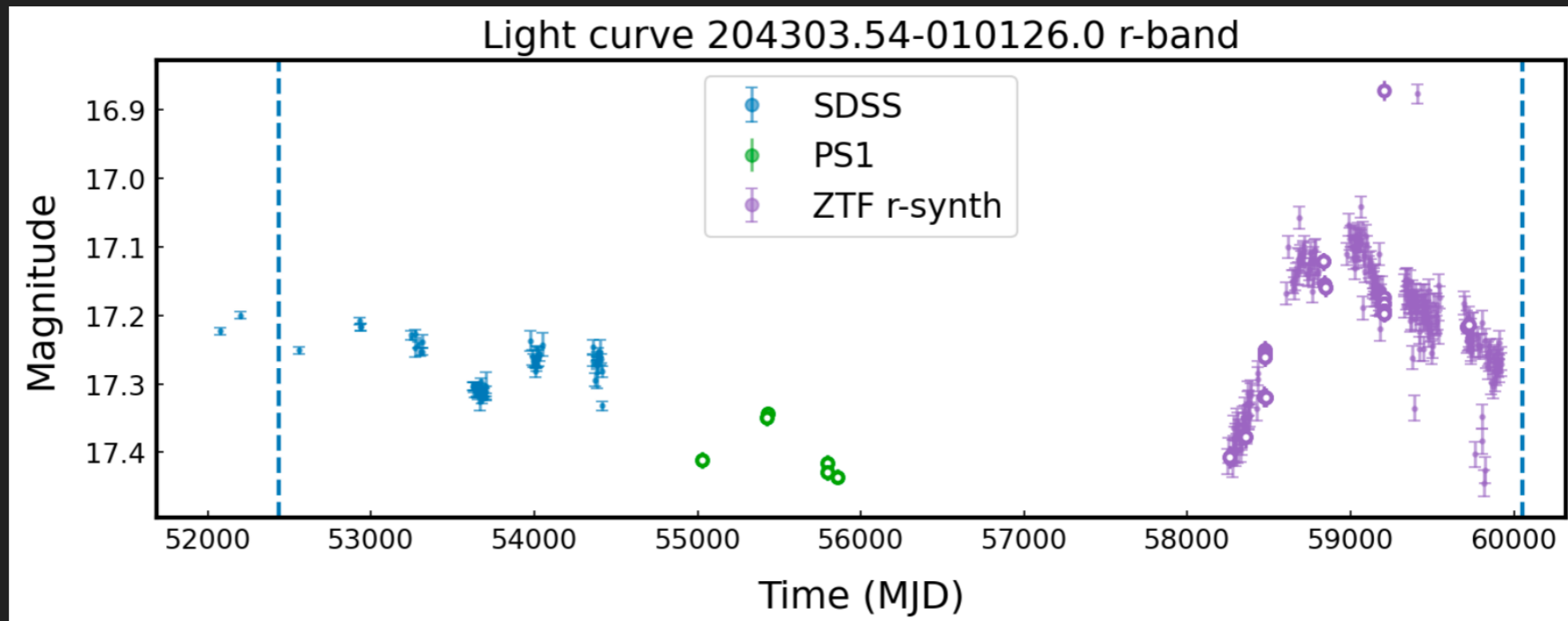
MJD51813: weak H β
 MJD51997: stronger H β and H α .

FOLLOW-UP SPECTROSCOPY 172322 (TURN-ON)



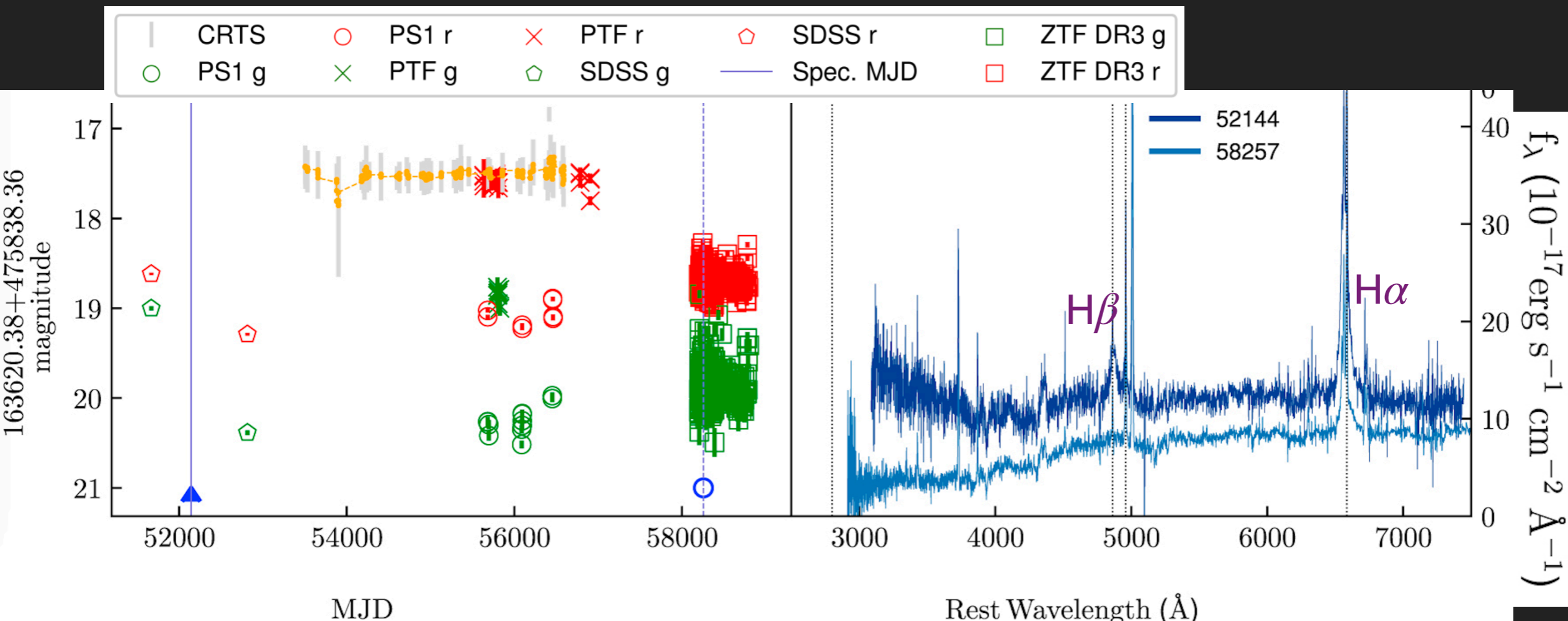
APO shows continued "turn on" trend

SPECTROSCOPY: J204303 (S82)



APO shows stronger blue continuum

FOLLOW-UP SPECTROSCOPY 163620 (TURN-OFF)

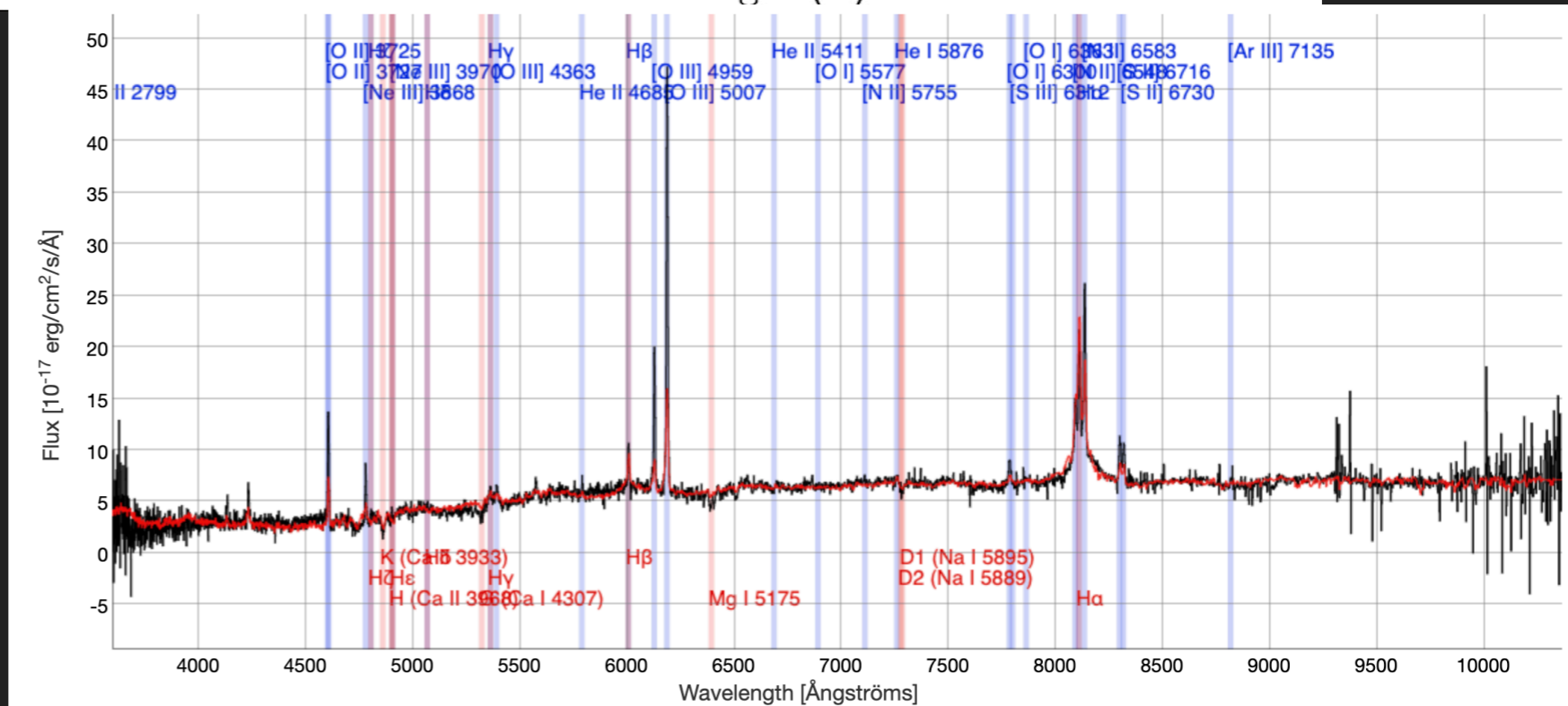


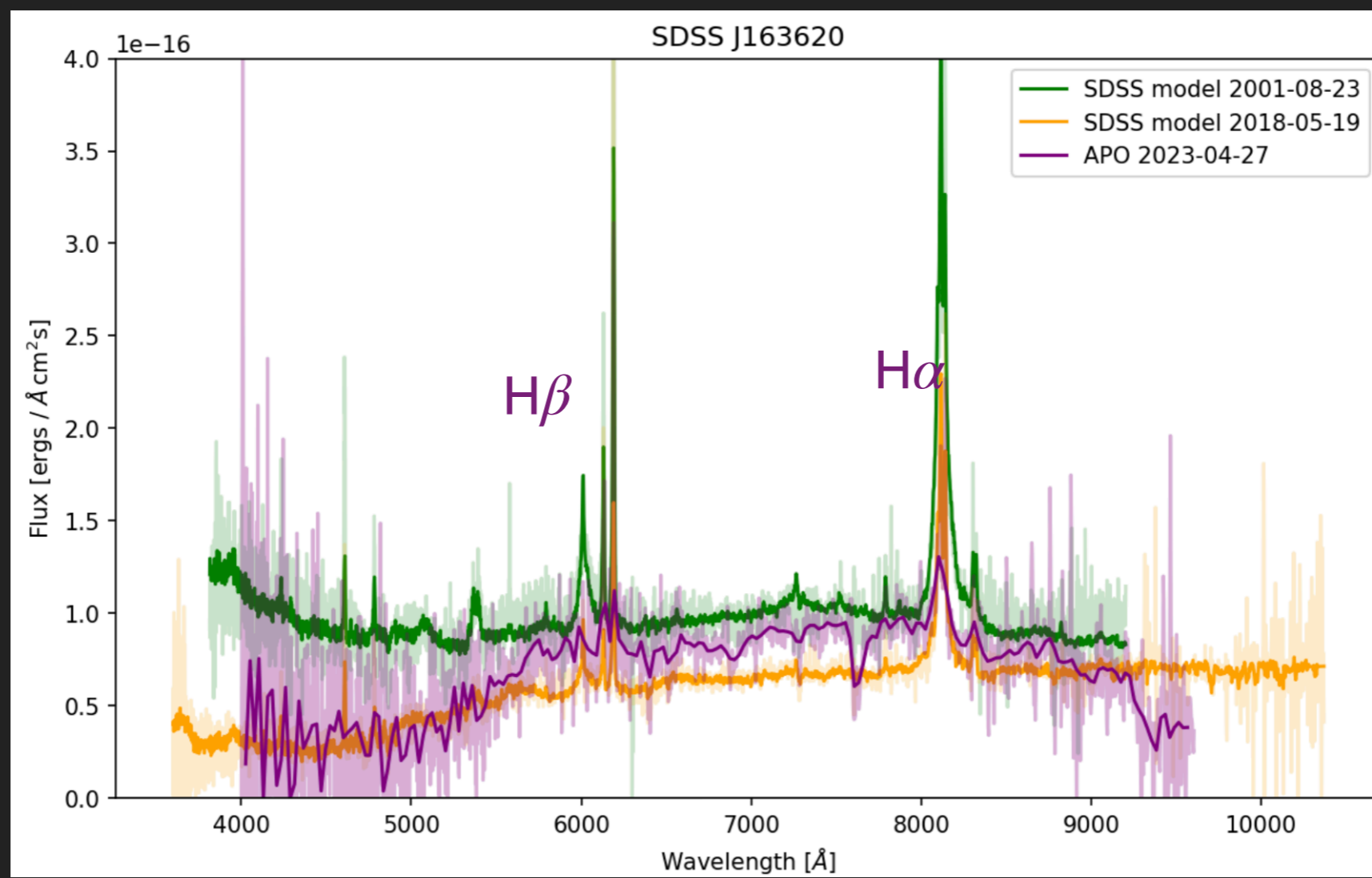
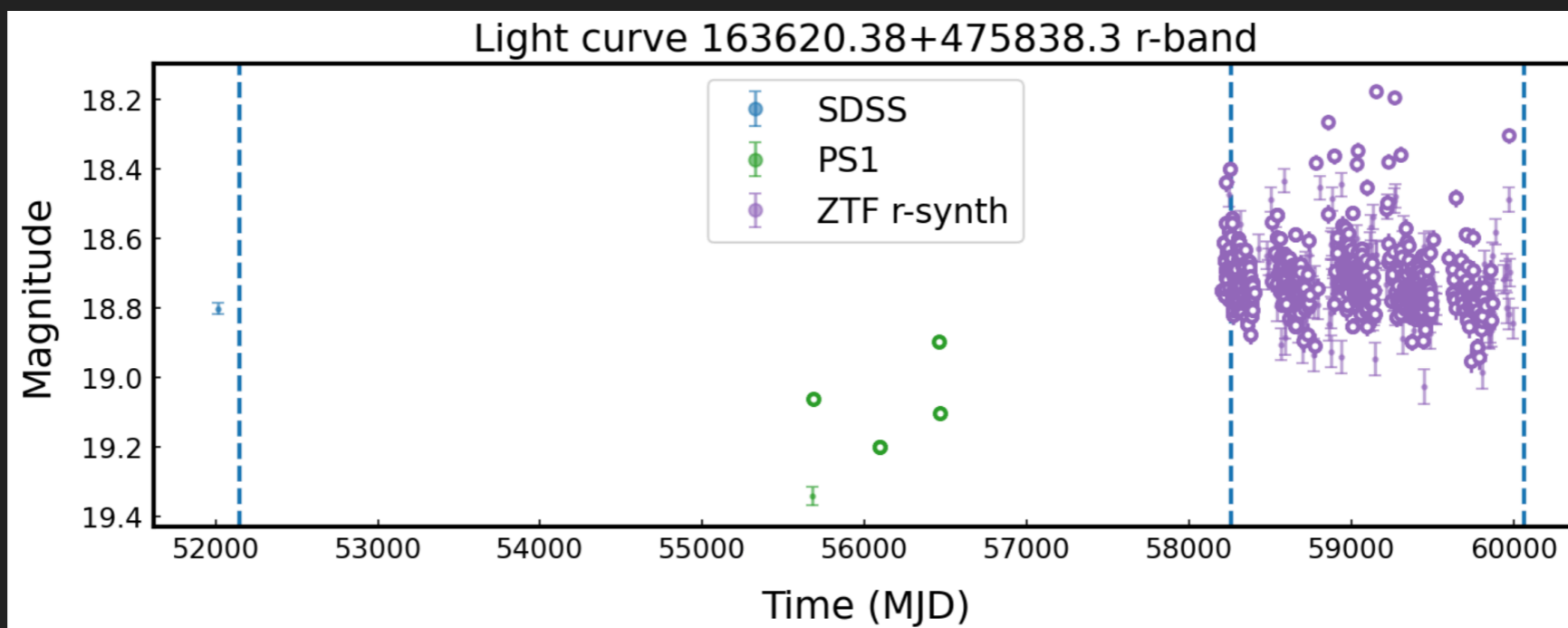
$z=0.236$

SDSS BOSS vs eBOSS:

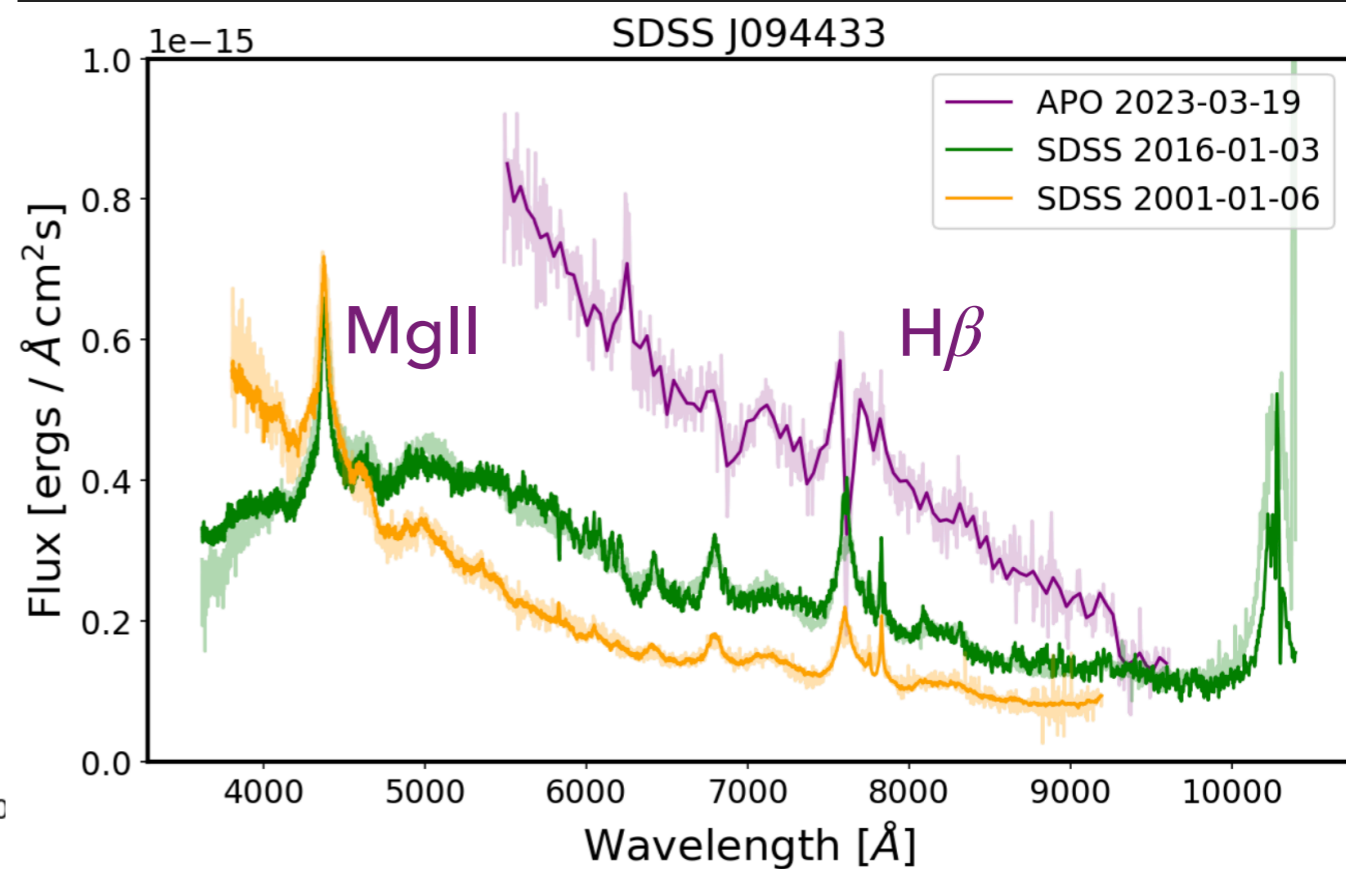
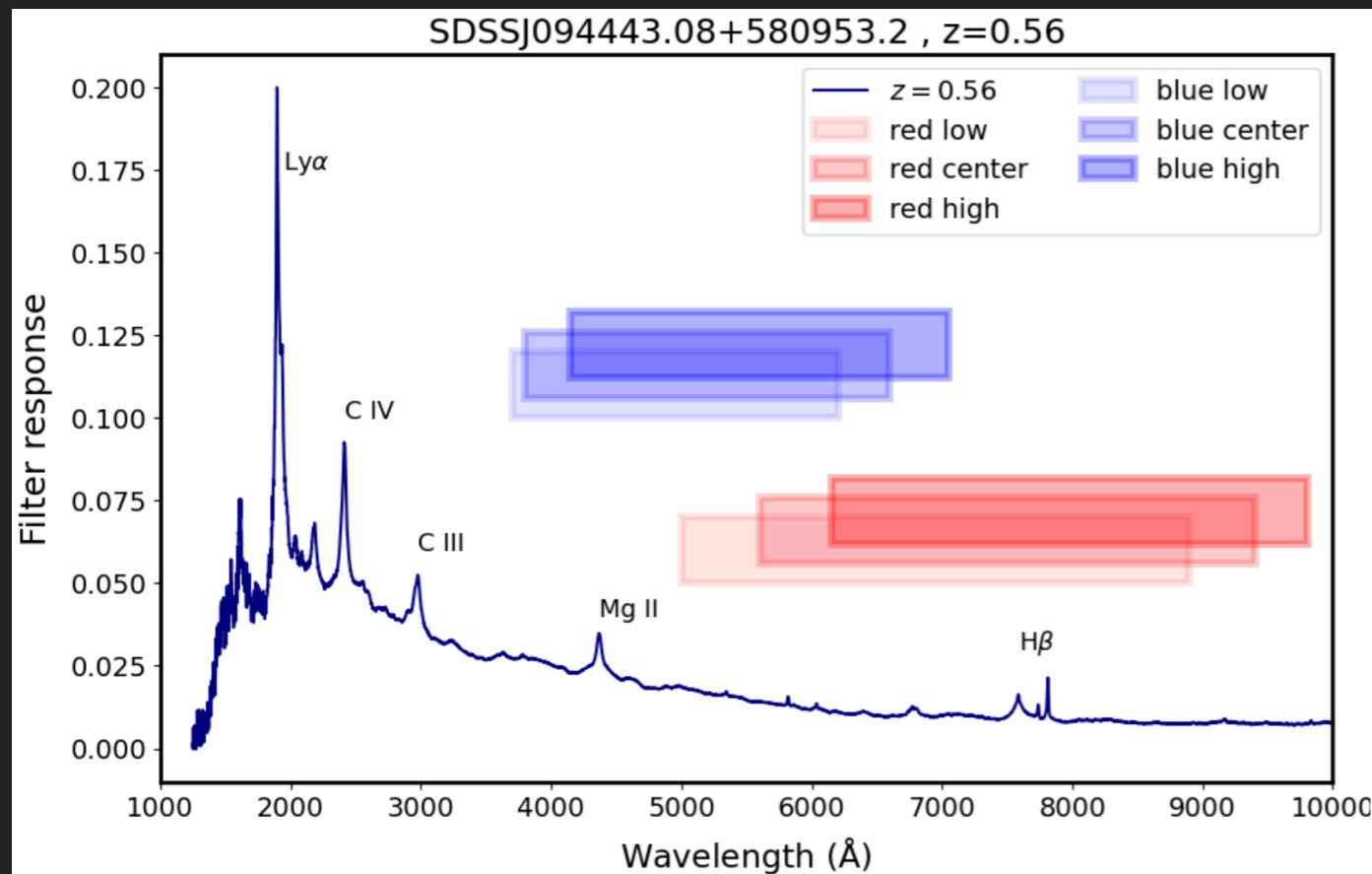
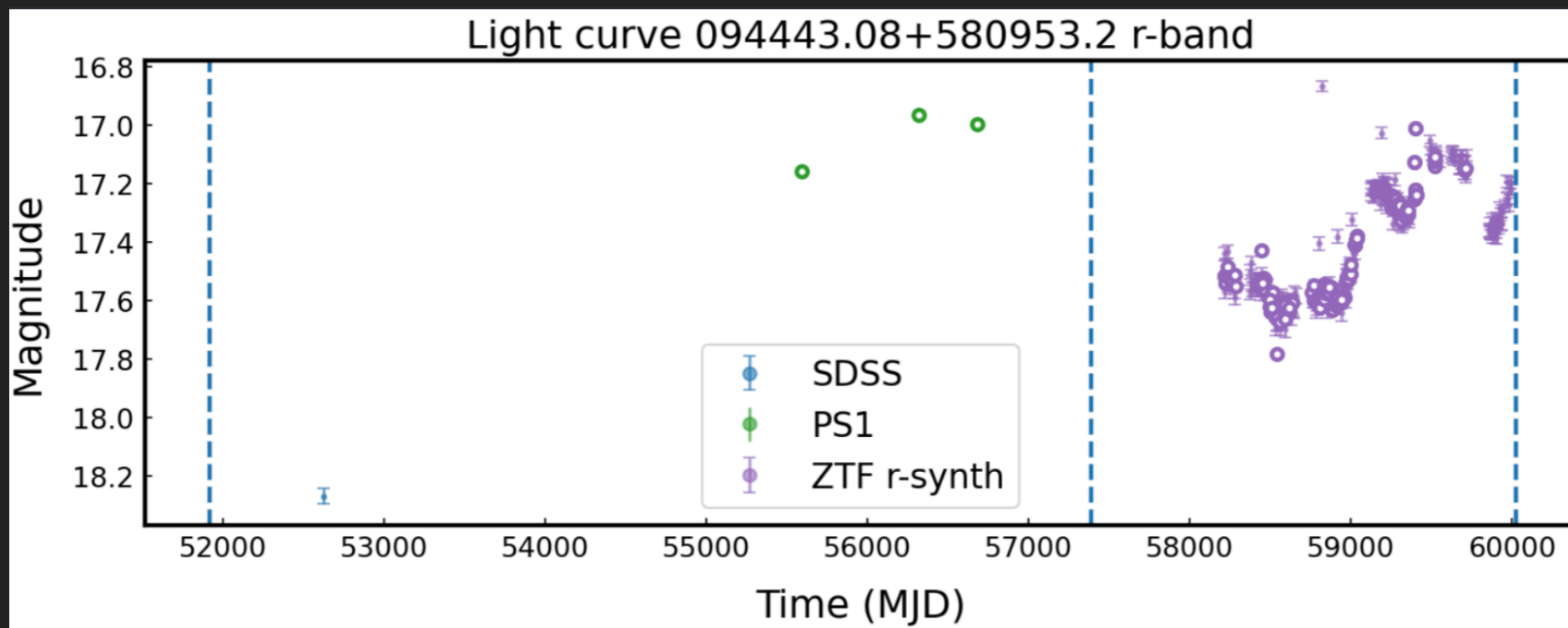
disappearance of $H\beta$

Green+2022, Fig.1.4

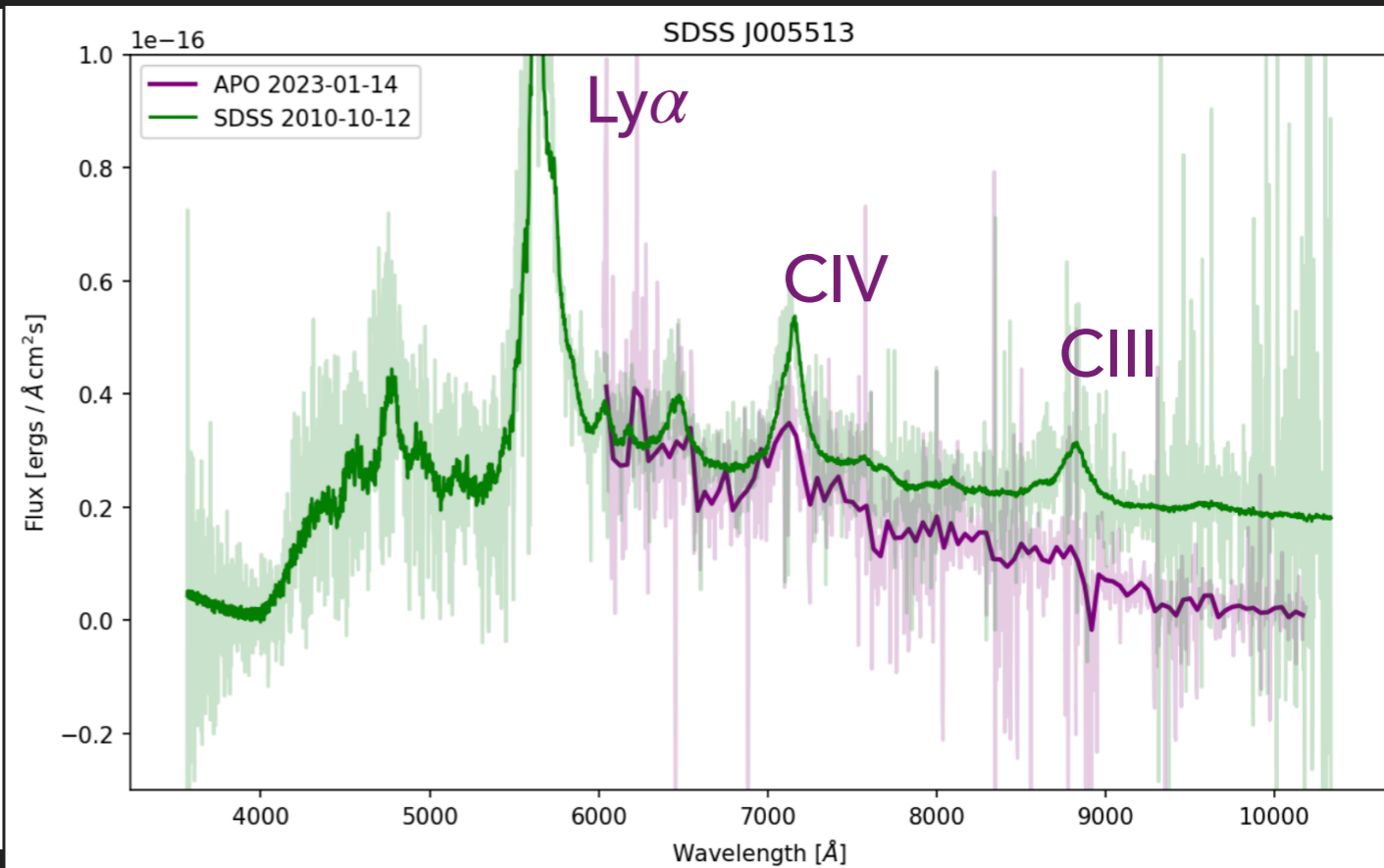
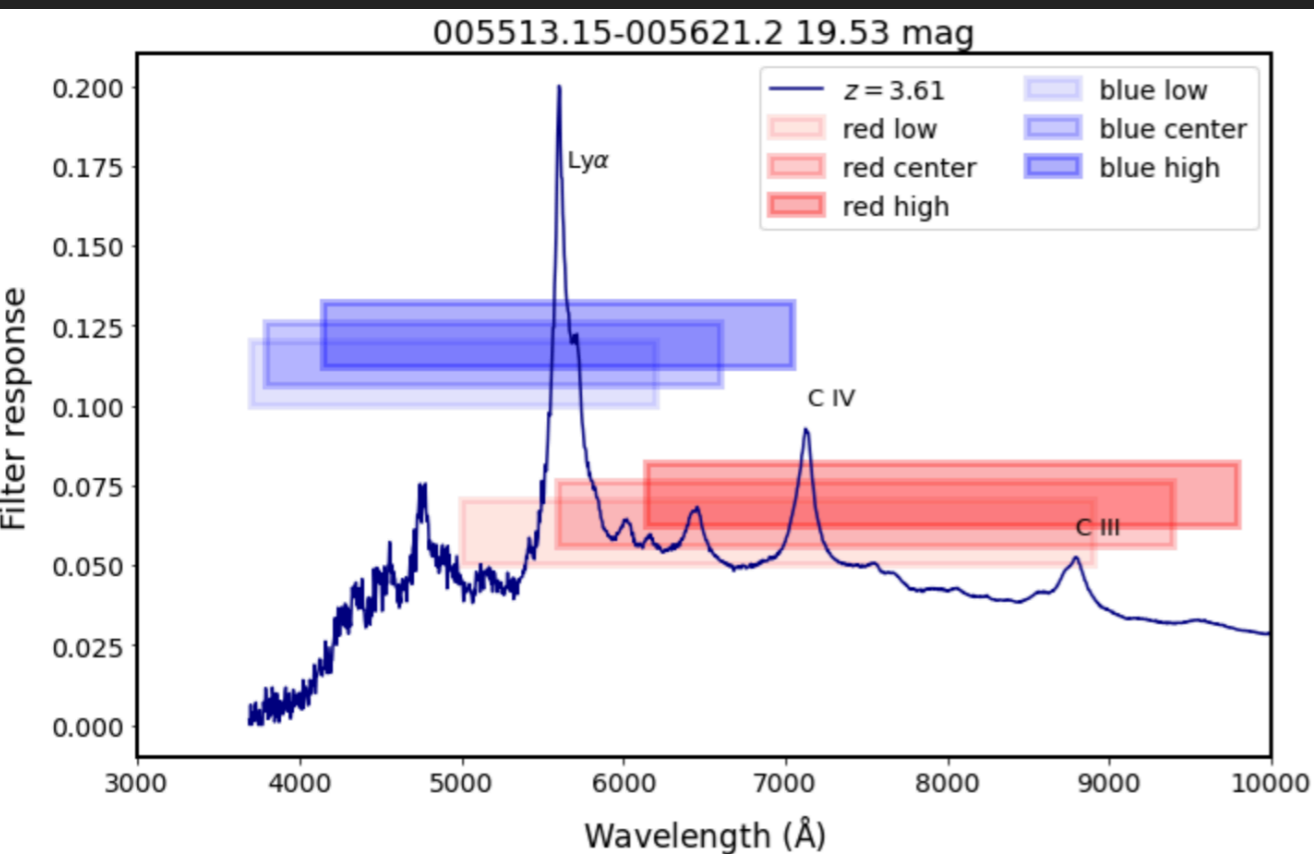
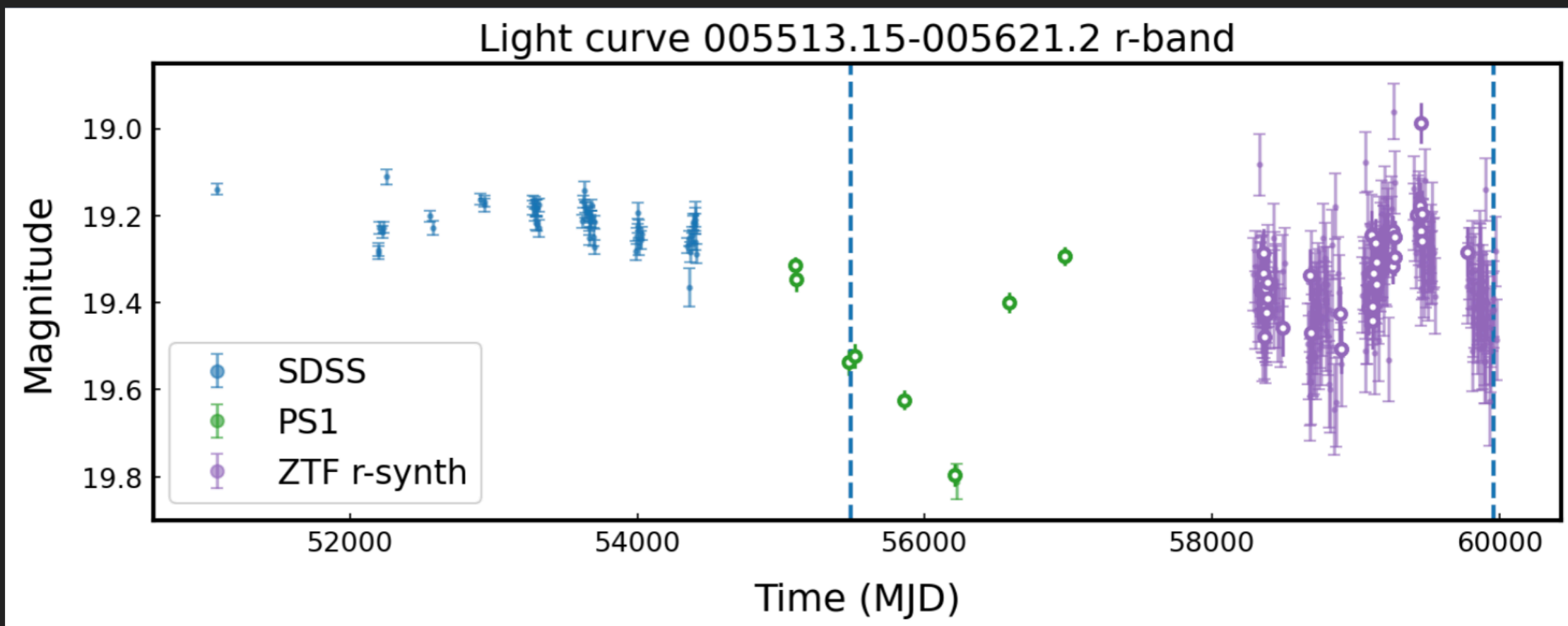




APO data:
Weak H α ,
continuum
returning
to earlier level



FOLLOW-UP SPECTROSCOPY: 005513 (S82)

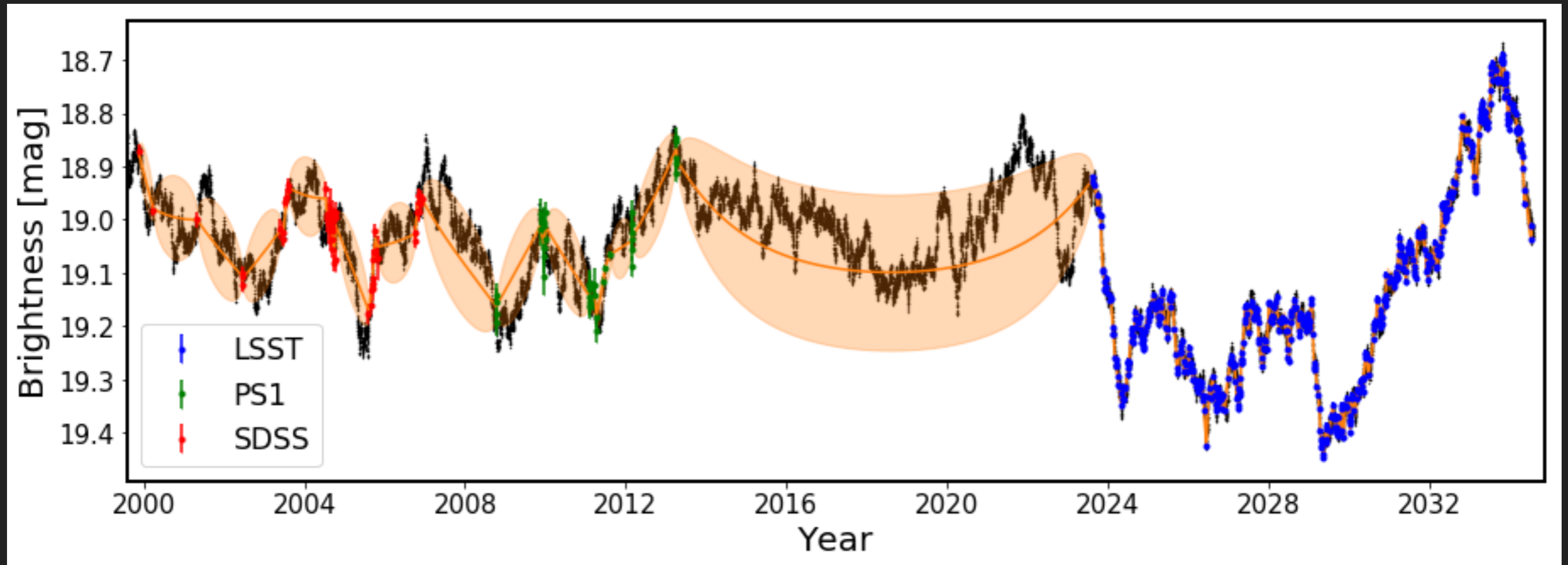


- ▶ Quasars are stochastically variable at the level of 0.2 mag
- ▶ Distinct variability pattern can be used to distinguish quasars from other variable objects
- ▶ Variability parameters can be linked to physical quantities such as the black hole mass, bolometric luminosity
- ▶ Combining SDSS, PS1, and (soon) LSST, we can recover quasar DRW parameters with much higher accuracy than before (and find interesting outliers in the process)



THANK YOU!

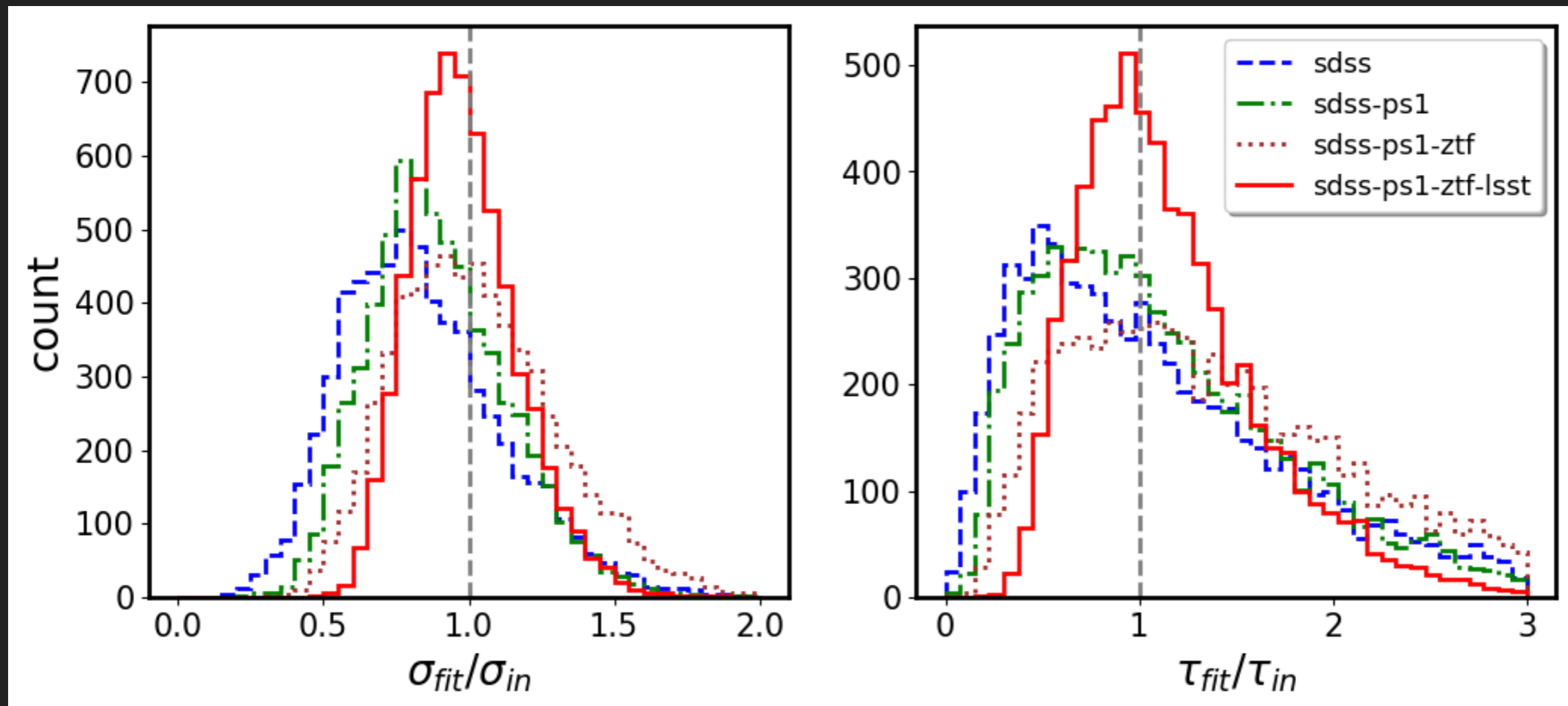
BACKUP SLIDES



- ▶ simulated quasar light curves, single input timescale and variability amplitude, sampled at realistic cadence

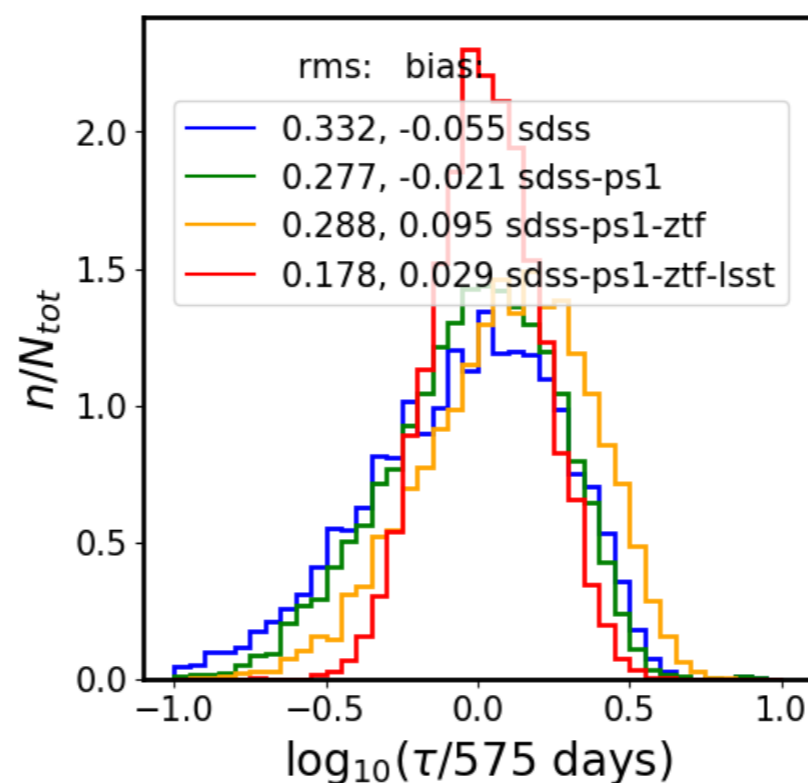
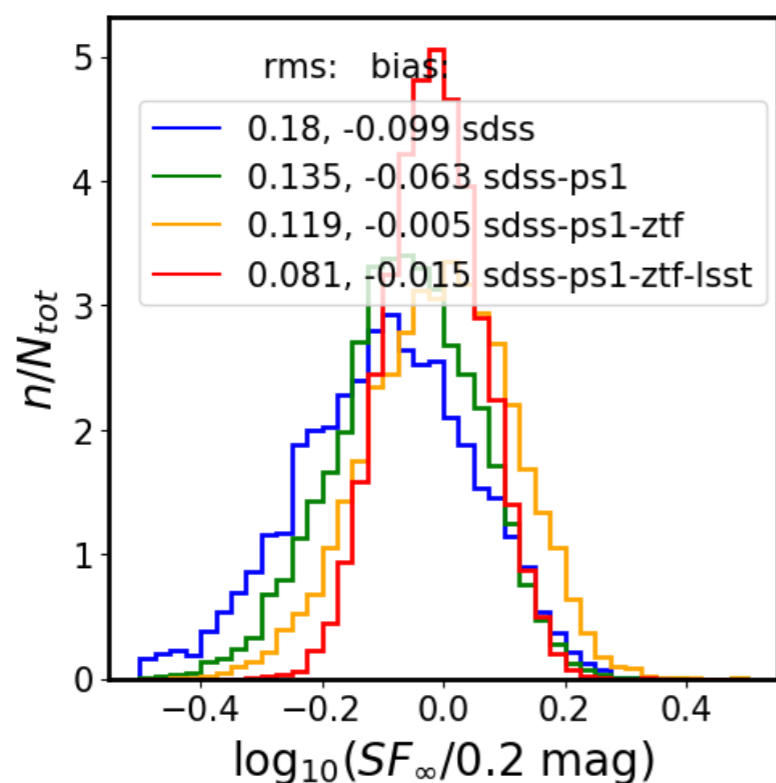
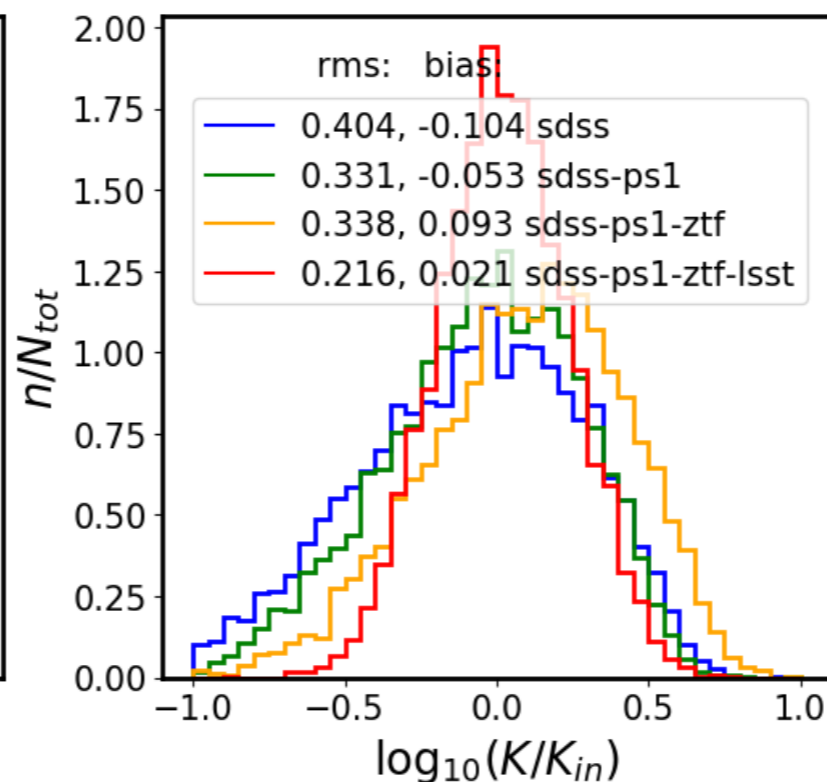
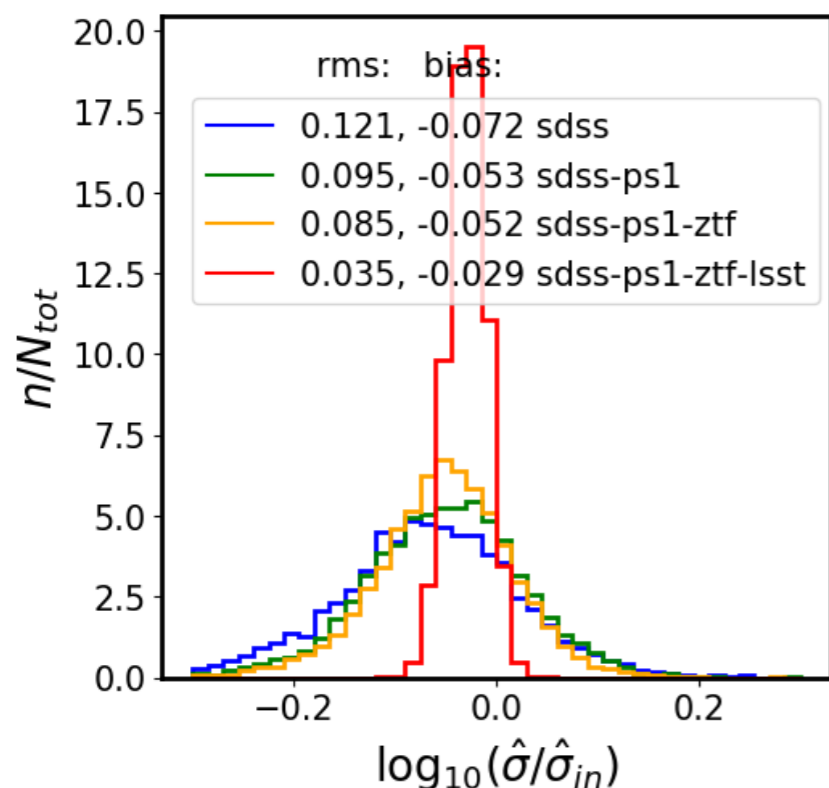
EXTENDING THE BASELINE : SIMULATION

- ▶ DRW parameter recovery improves with baseline extension



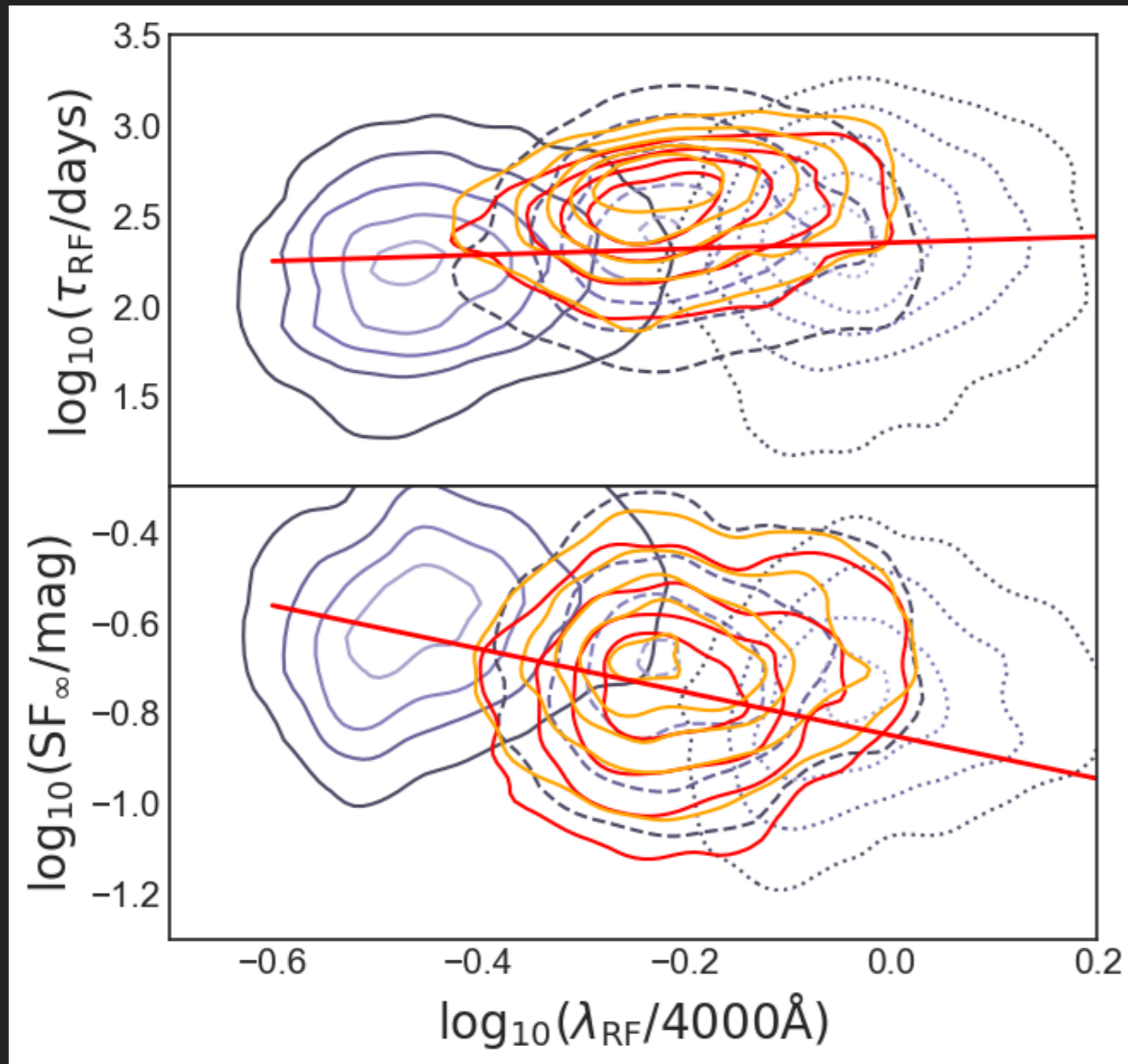
- ▶ ZTF will make things better, but LSST will be awesome

EXTENDING THE BASELINE : SIMULATION



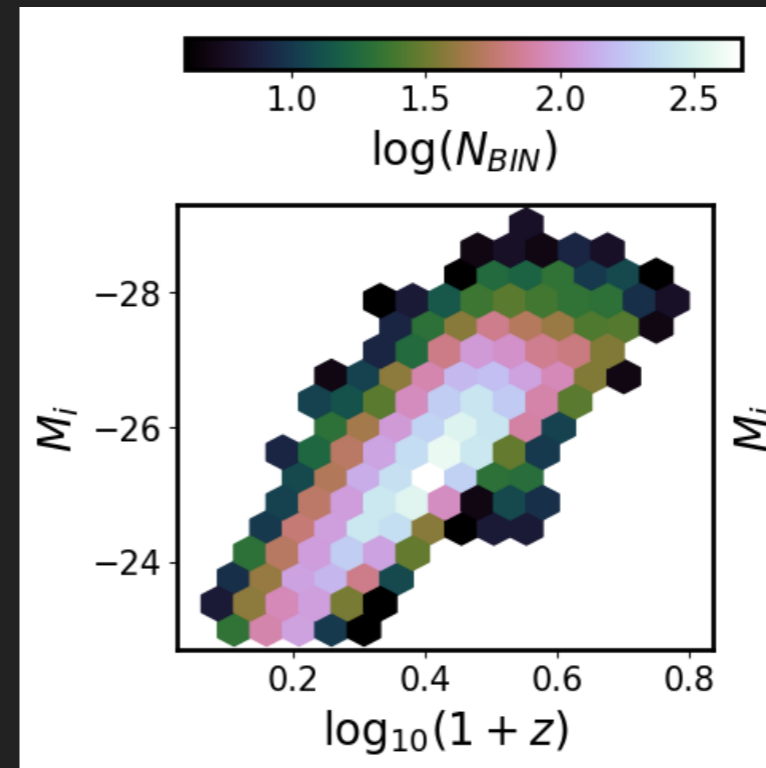
▶ ZTF will make things better, but LSST will be awesome

▶ we decided to not include ZTF due to color offset

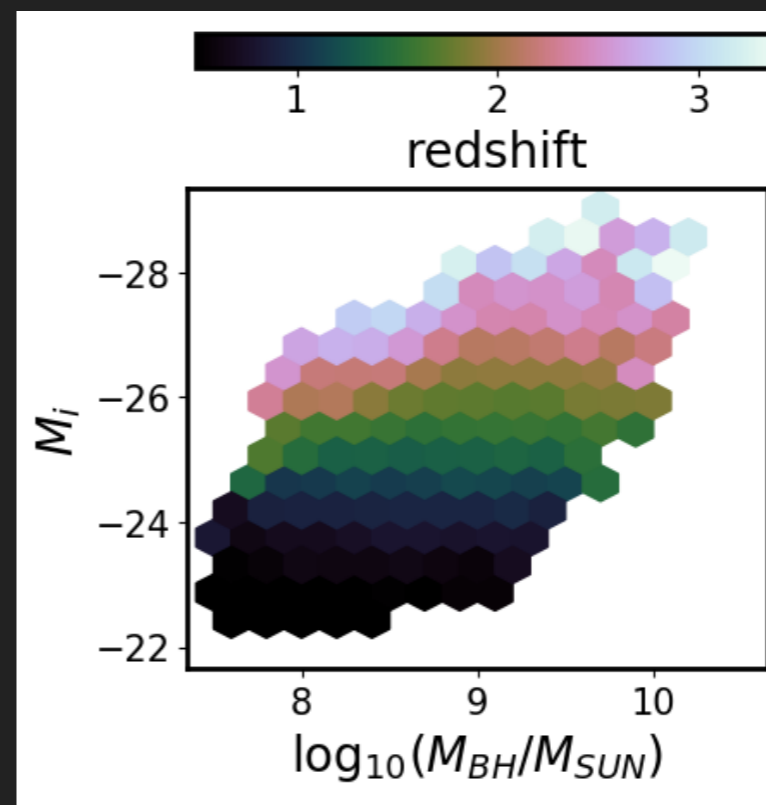


- ▶ correct for wavelength-dependence: because SDSS ugriz bandwidths is fixed, the higher the redshift, the shorter the rest-frame wavelength probed

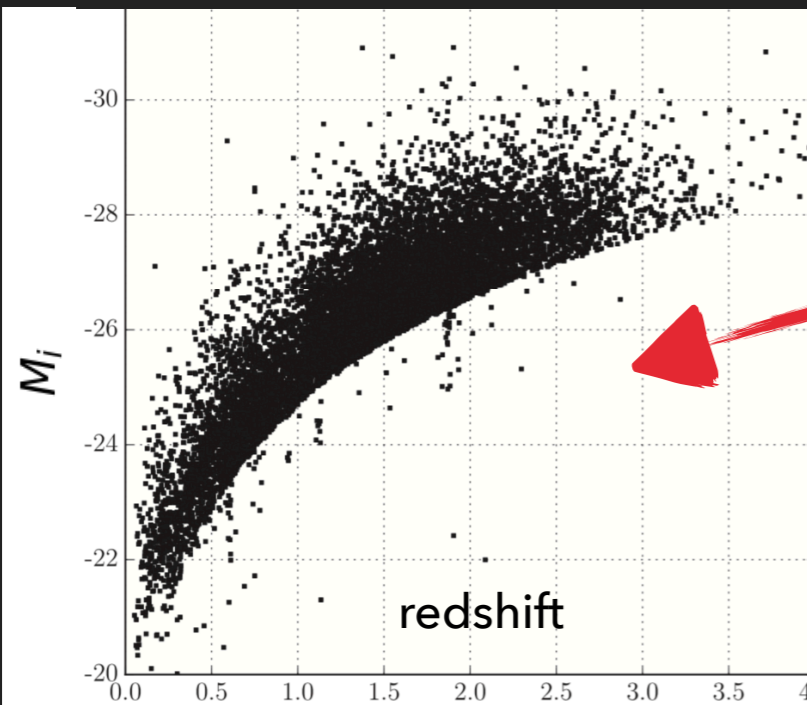
- ▶ magnitude limit illusion, aka luminosity-redshift degeneracy - we see only the most luminous QSO (magnitude limit)



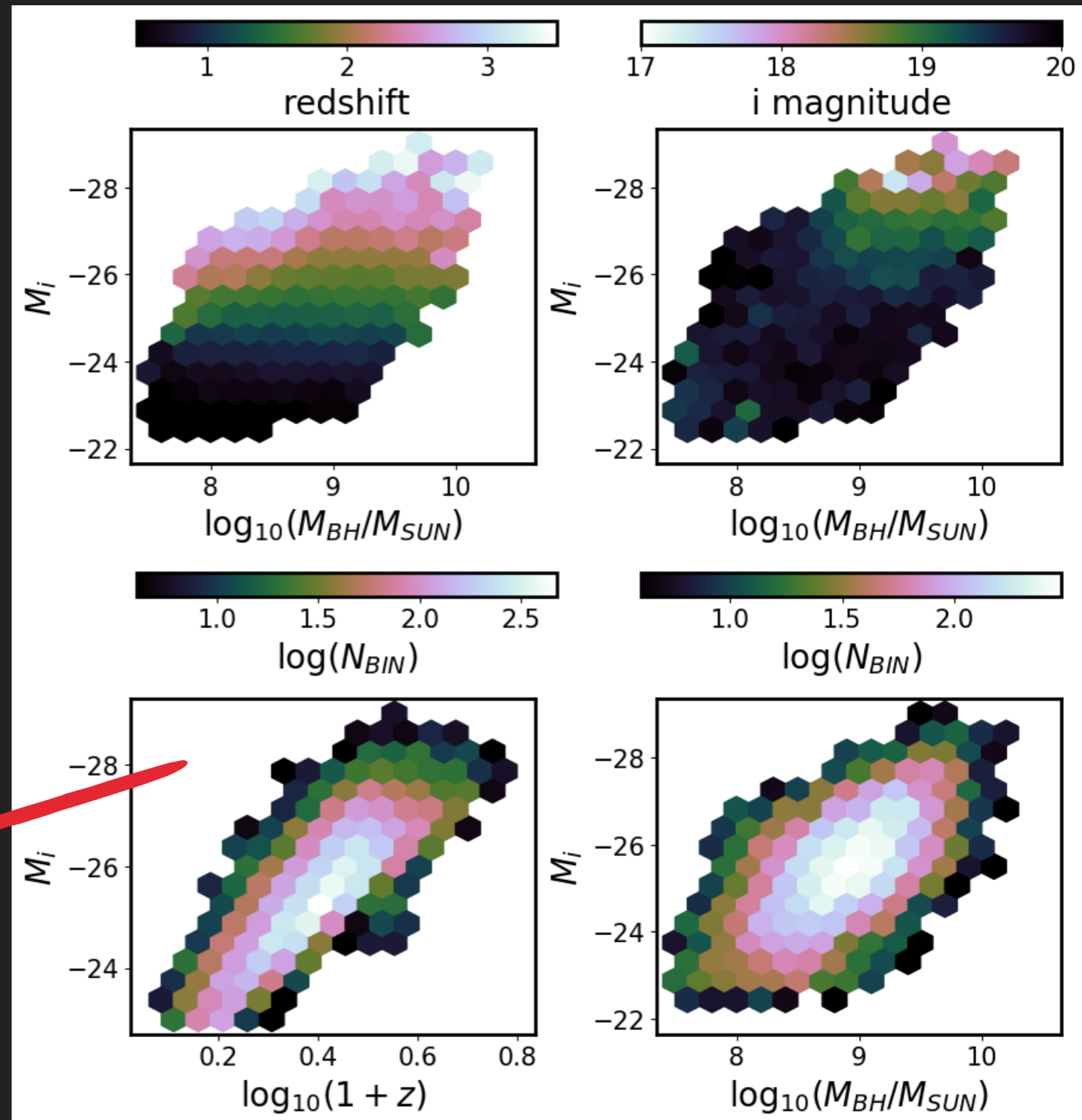
- ▶ L-z degeneracy is independent of black hole mass



- ▶ luminosity-redshift degeneracy - we see only the most luminous QSO (magnitude limit) - independent of black hole mass
- ▶ shorter rest-frame wavelength probed at higher redshifts

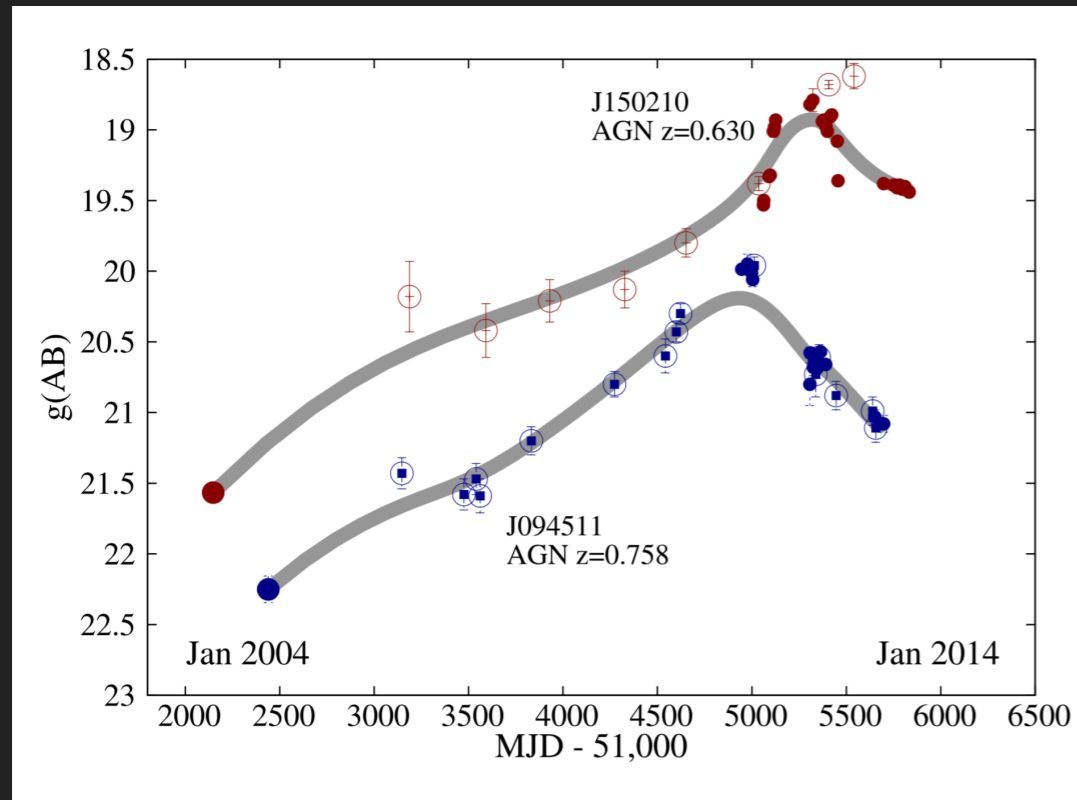


Dong+2018

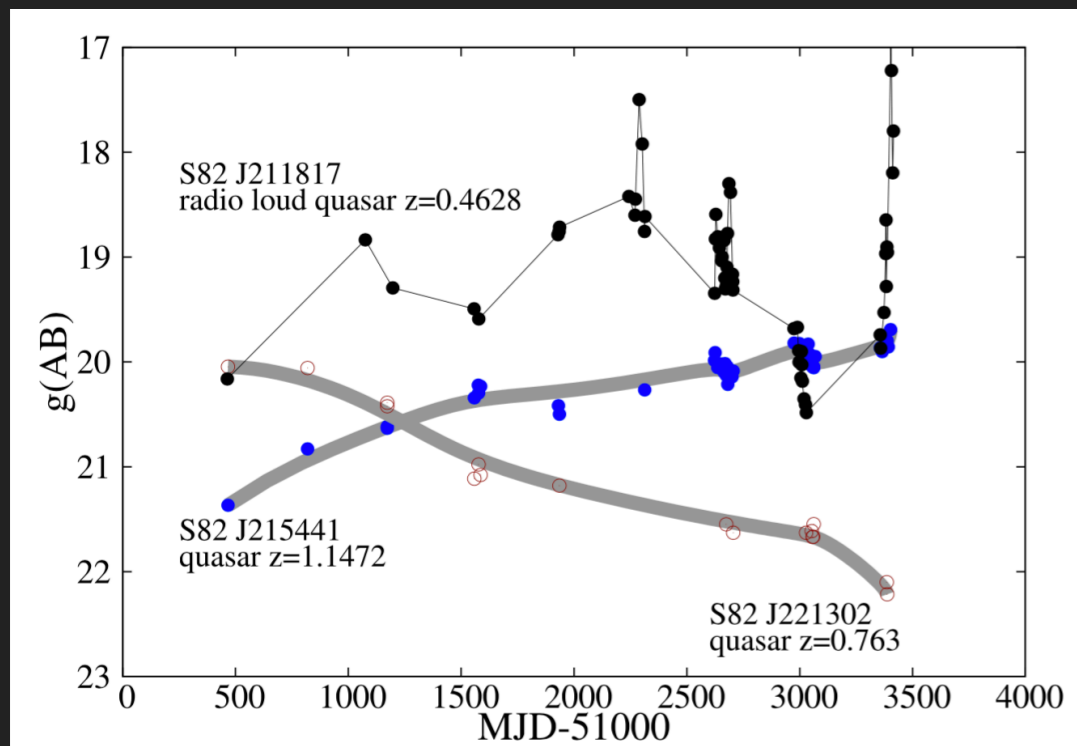


CLQSO EXAMPLES

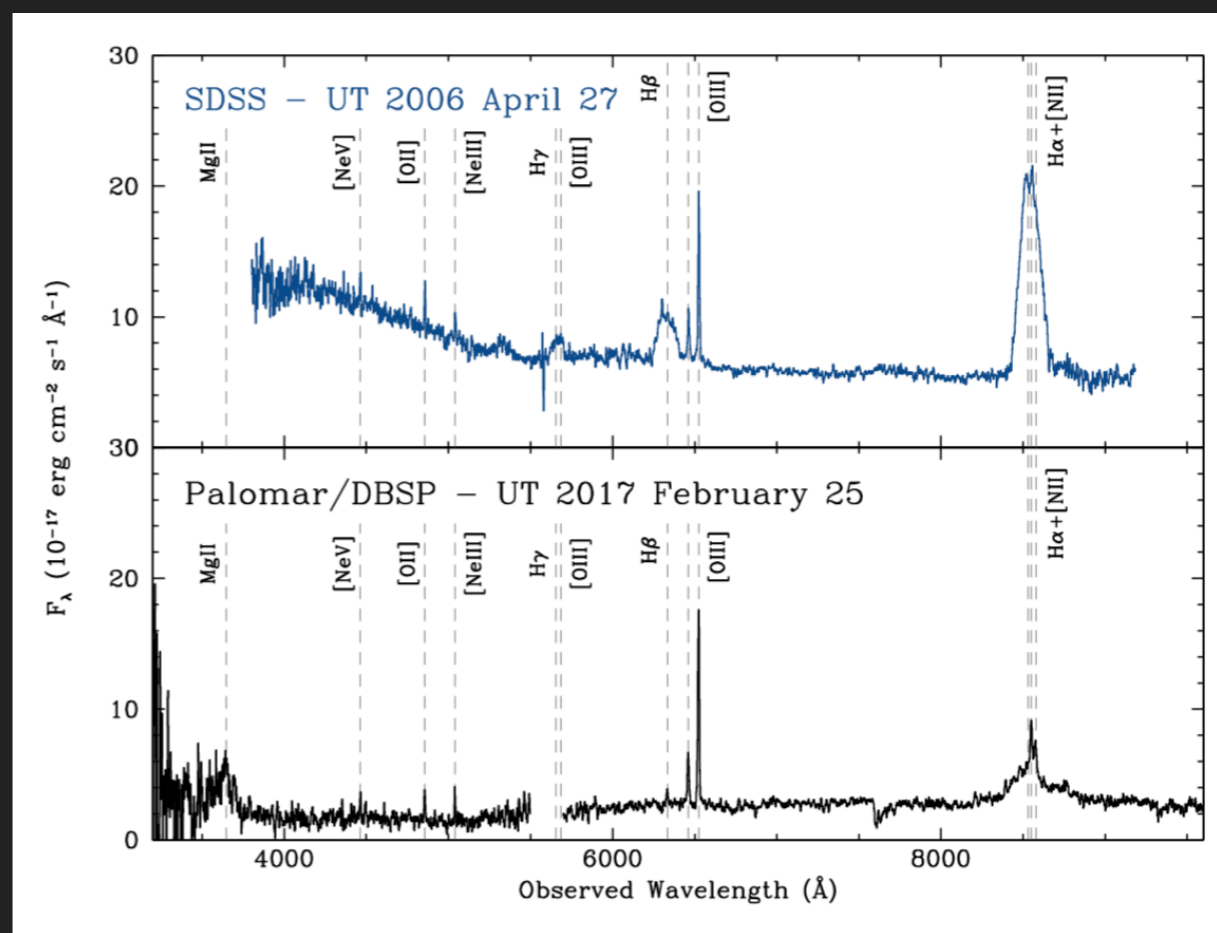
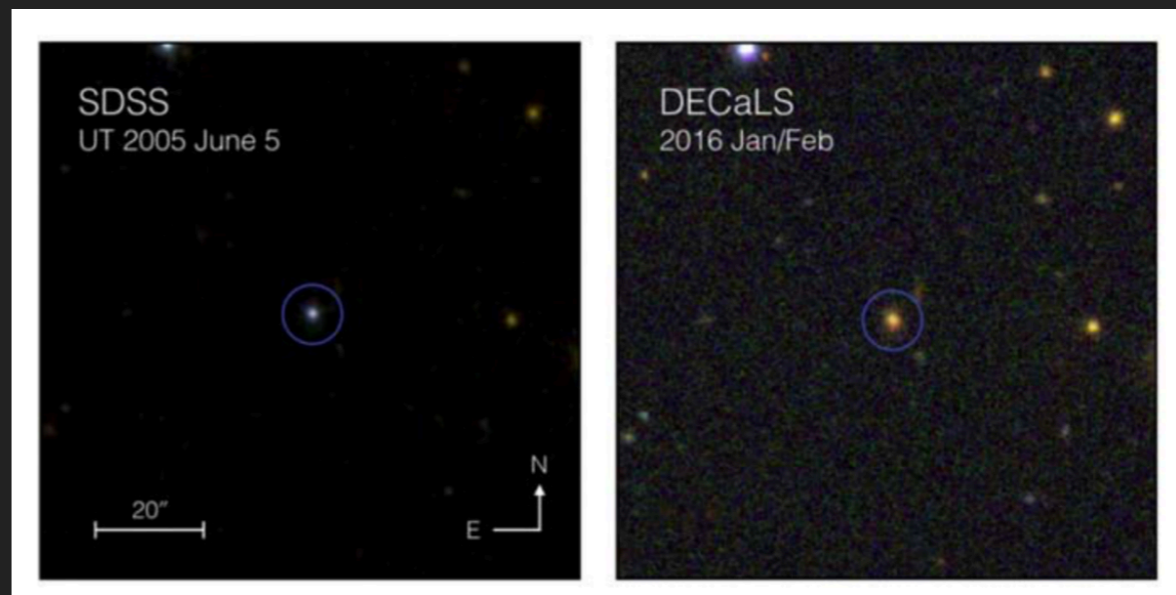
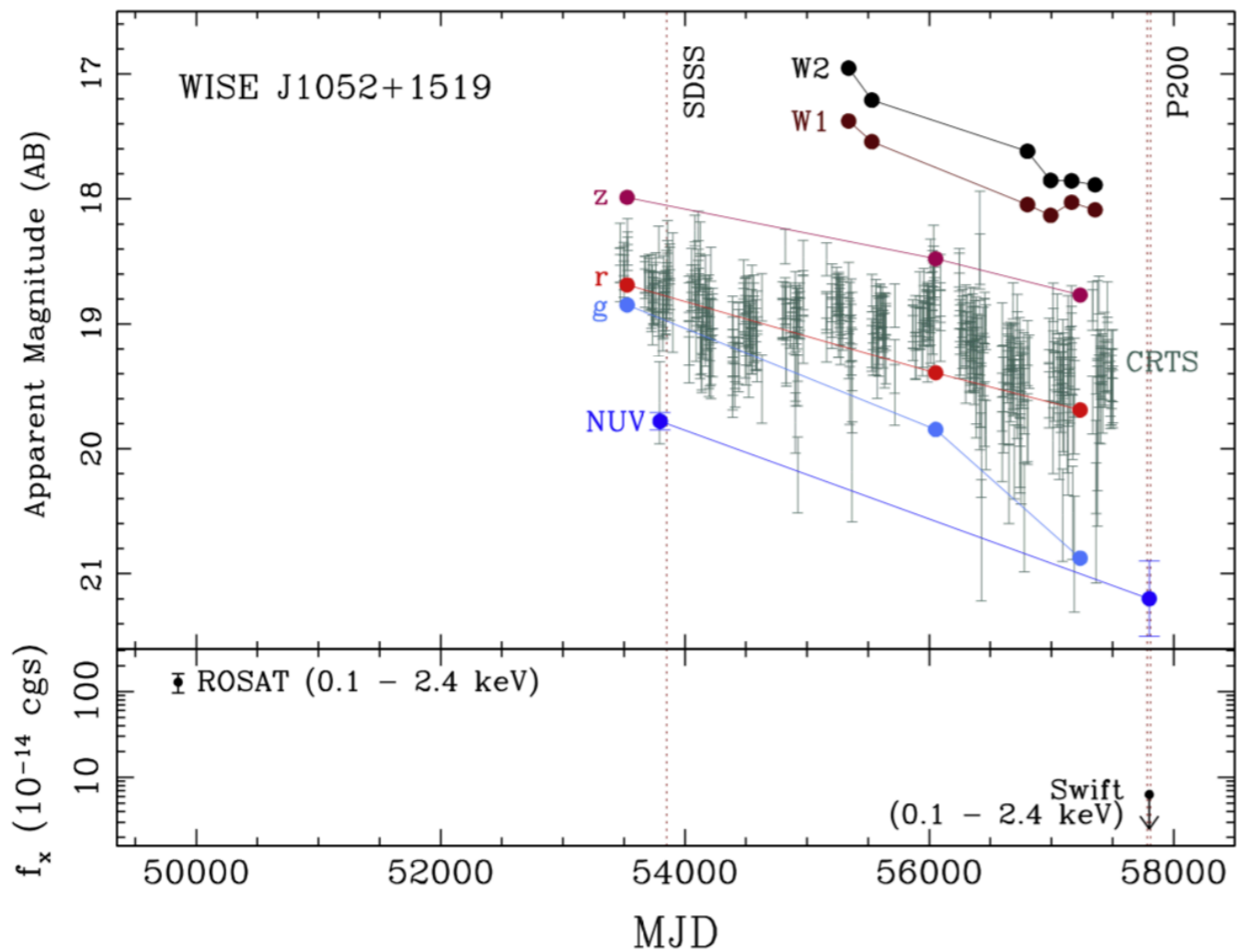
CLQSO: LAWRENCE+2016



Lawrence+2016, Fig.7



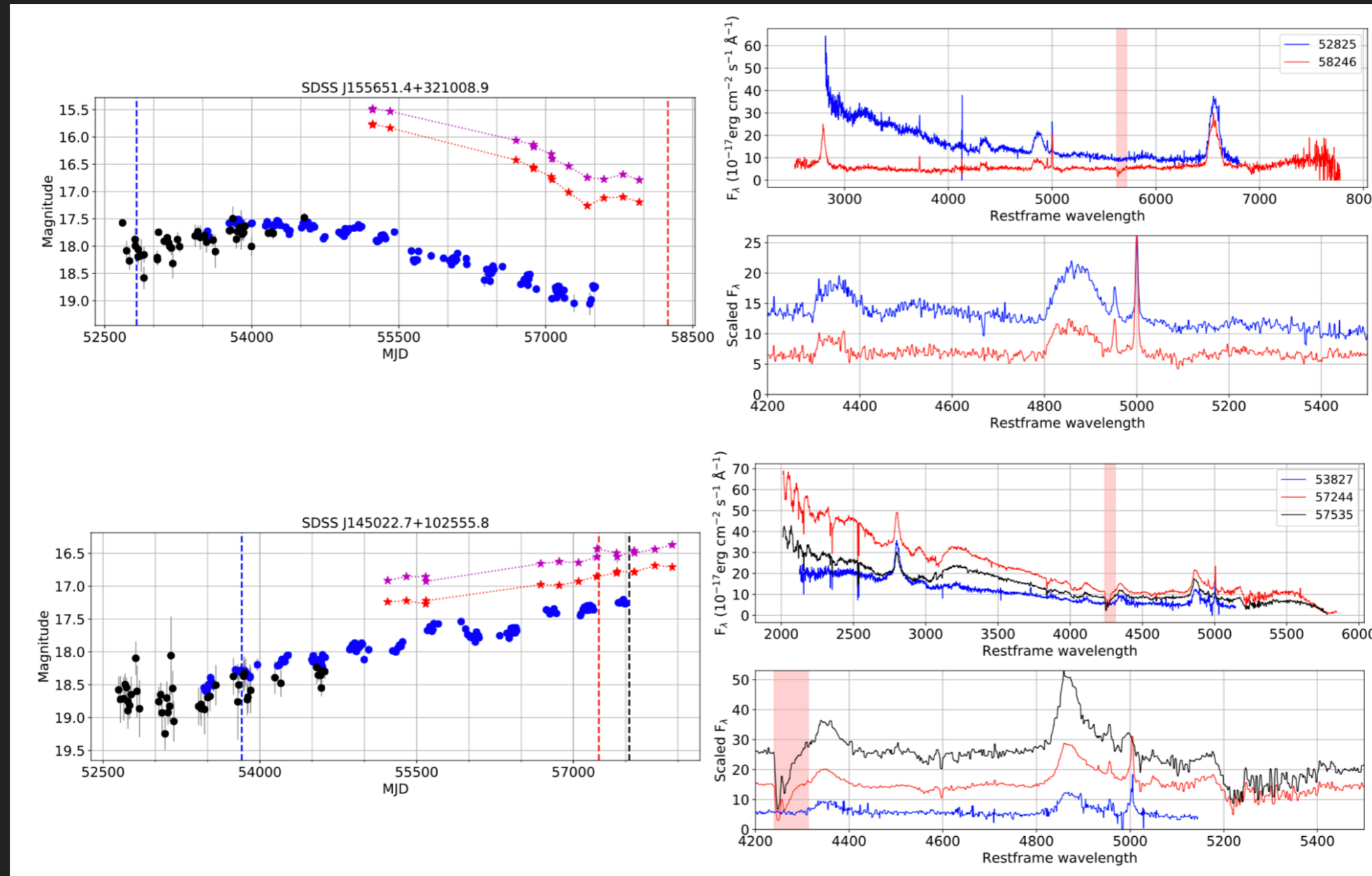
Lawrence+2016, Fig.14



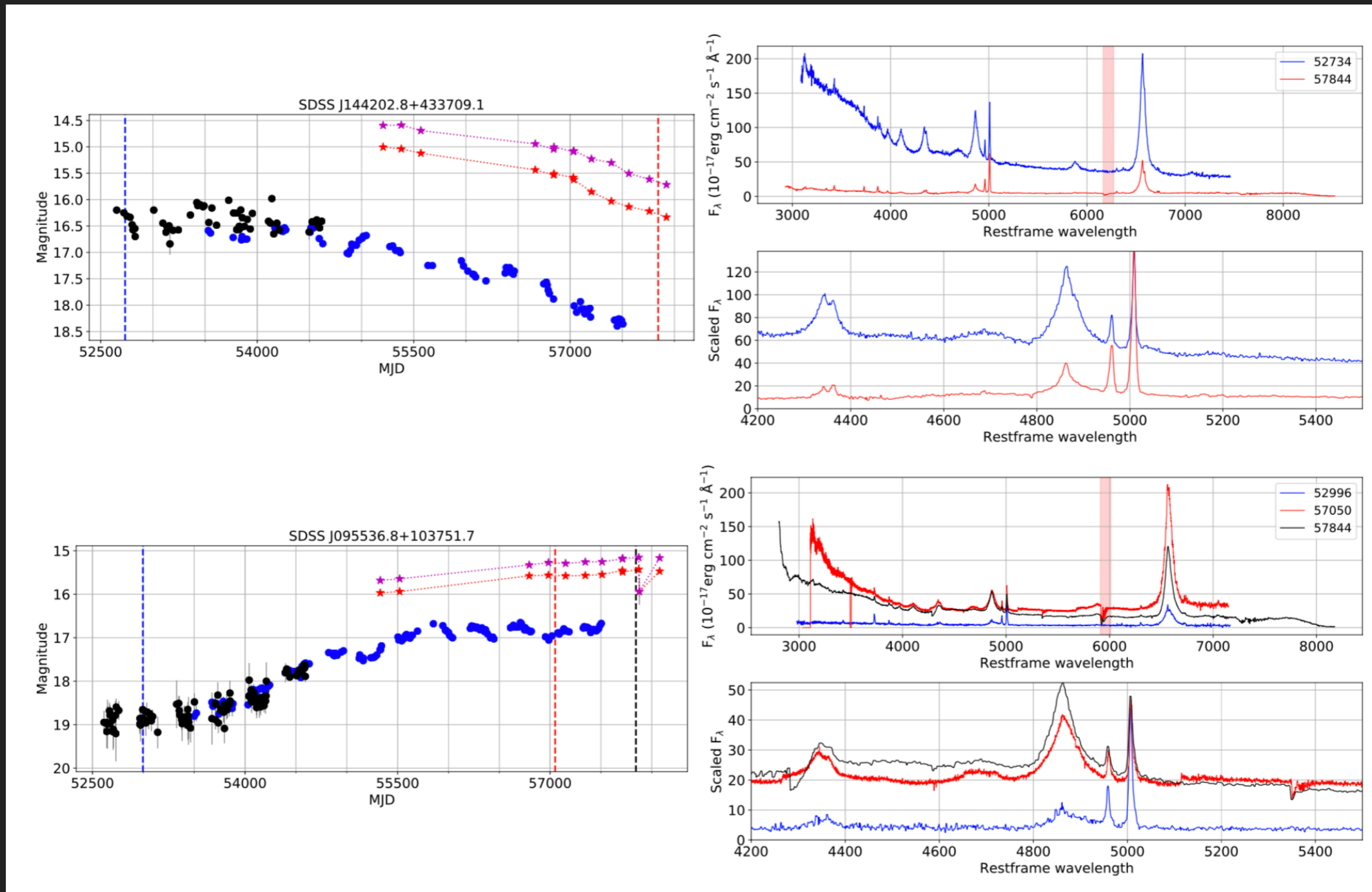
TDE lensing

dust flares

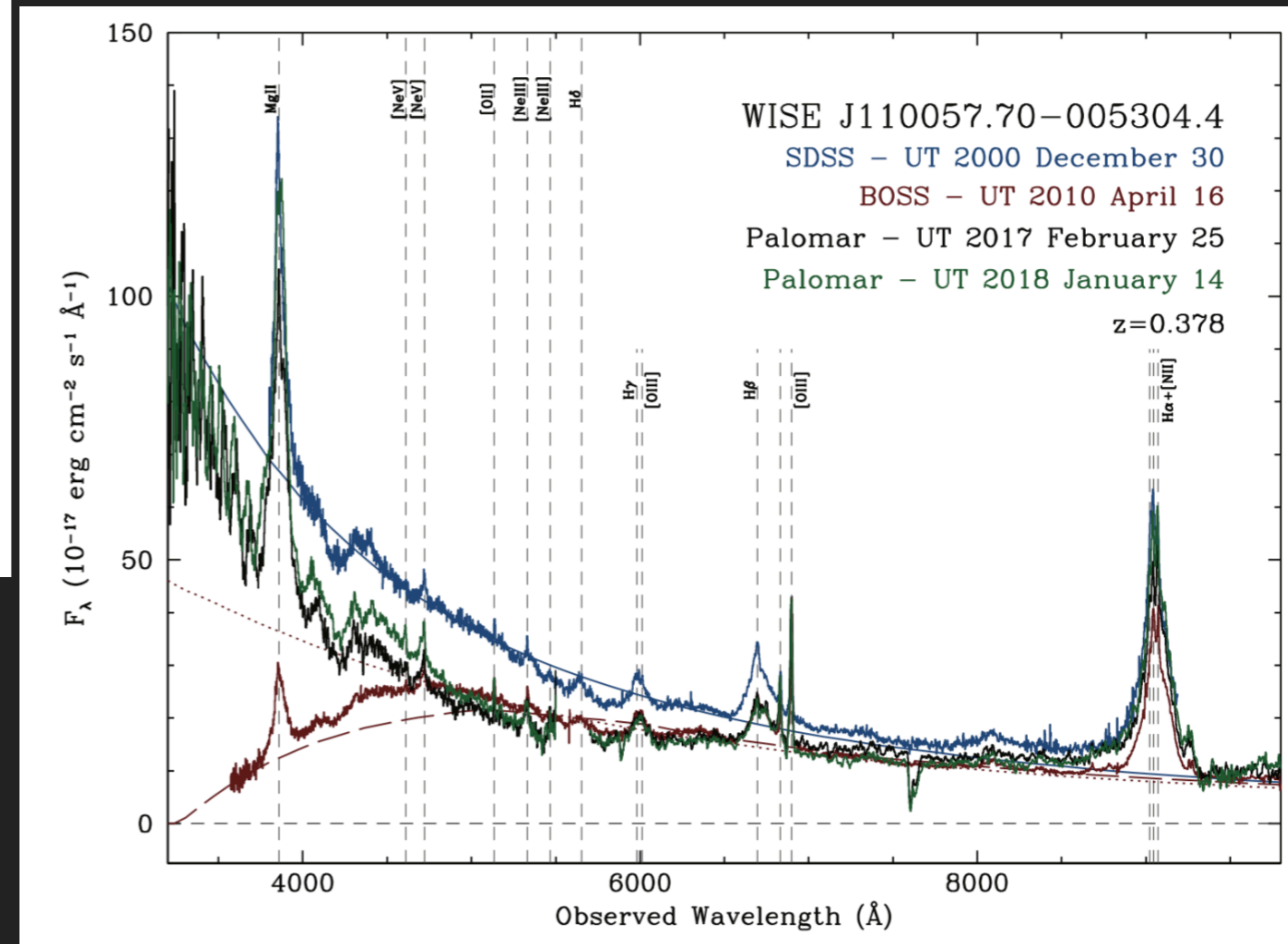
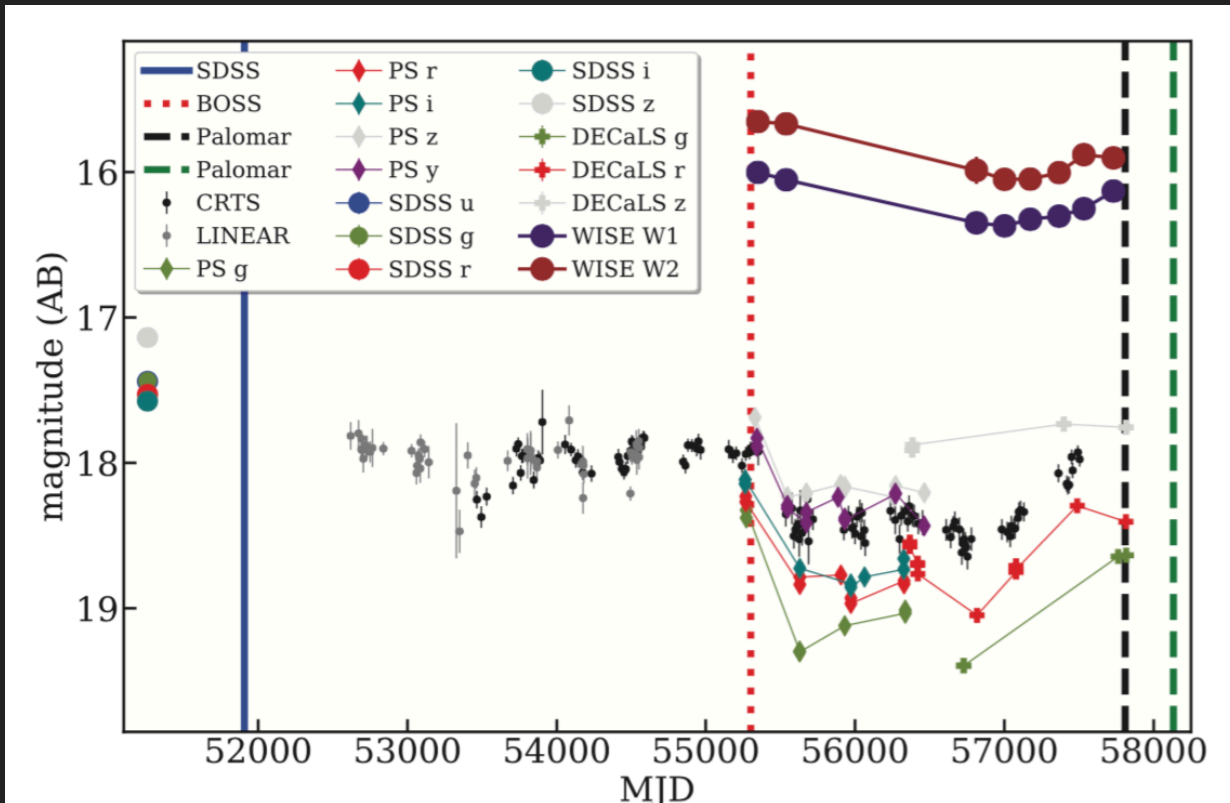
CLQSO: GRAHAM+2019



APPLICATION: OUTLIERS ARE INTERESTING



CLQSO: ROSS+2018



Ross+2018, Fig.1,2