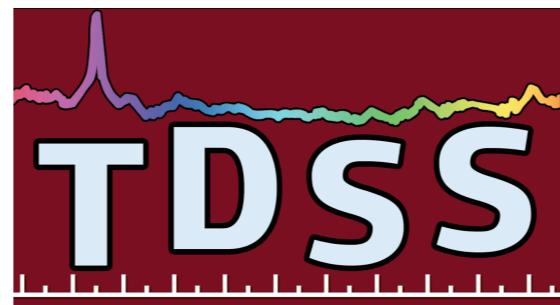


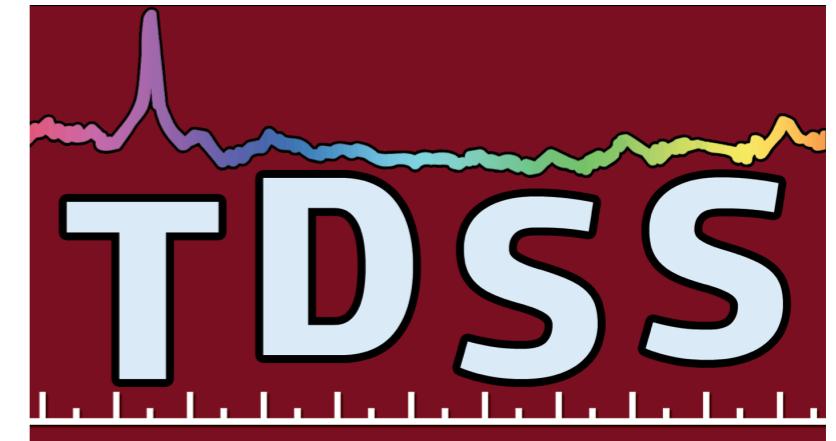
The Time Domain Spectroscopic Survey: Stellar Variables

Benjamin Roulston (BU/SAO/CfA)
SDSS-IV Meeting, 2019
Ensenada, Mexico

Paul Green (P-I, CfA), Scott Anderson (P-I, UWa), Michael Eracleous (PSU), Eric Morganson (UIUC), John Ruan (UWa), Jessie Runnoe (UMich), Niel Brandt (PSU), Don Schneider (PSU), Yue Shen (UIUC), the TDSS Team, the SDSS-IV Collaboration, and the Pan-STARRS1 Science Consortium



SDSS-IV TIME DOMAIN SPECTROSCOPIC SURVEY



- Adds dedicated spectra to era of time domain imaging.
- First large-scale, *inclusive* spectroscopic survey of variable sources
 - No color selection
 - Generic variability, i.e., no requirement for periodicity, flares, etc.
- Extending Survey Science to the Time Domain/Spectroscopy through:
 - ***Systematic discovery*** of celestial variables
 - ***Population studies*** of variable stars and quasars
 - ***Exploring the unknown:*** rare objects

Overview:

Three principal components of TDSS, piggy-back on



Main survey

↑

eBOSS ELG plates

↓

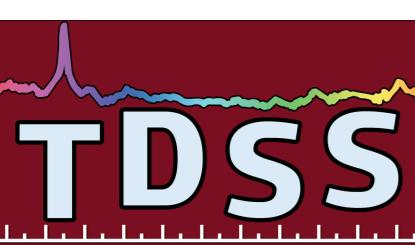
- TDSS main (90%) survey: **SES**=single-epoch spectroscopy BOSS classification/characterization spectra of imaging variables from Pan-STARRS I, 3 π imaging survey (PSI); $\sim 10^5$ fibers in SDSS-IV ($10/\text{deg}^2$)
- TDSS (10%) **FES**=few-epoch spectroscopy of potential spectral variables of interest (e.g., known from SDSS I-IV spectra) $\sim 10^{3-4}$ fibers in SDSS-IV
- TDSS **RQS**=repeat quasar spectroscopy of SDSS I-IV quasars; $\sim 10^4$ fibers in SDSS-IV



10% of TDSS fibers for special FES programs:

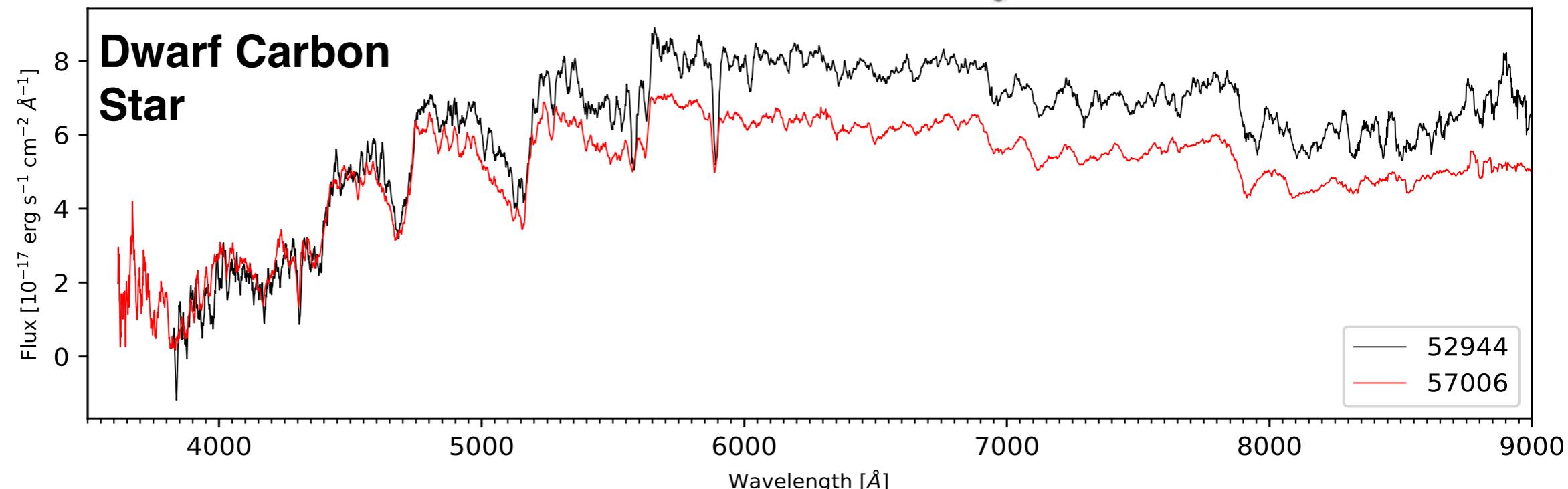
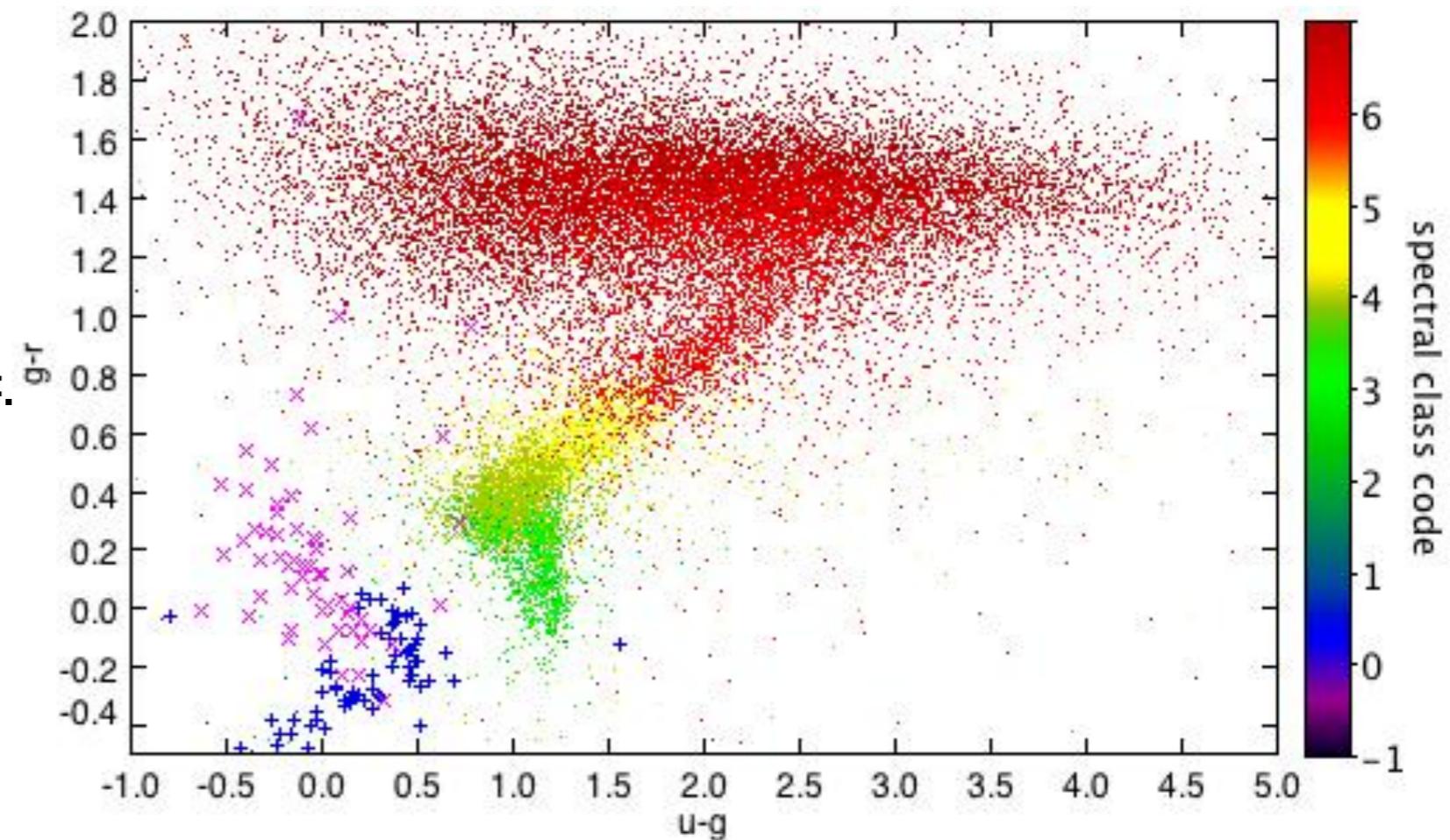
Target Type	Number	Observed (March '19)
Total (~1 deg⁻²)	9143	6261
WD/dM Binaries	1036	214
Dwarf Carbon Stars	830	370
Ultracool Dwarfs	402	556
Hypervariable Stars ($\geq 0.3m$)	1150	727
BAL Quasars	2900	1926
High S/N Quasars	1100	593
Double Peaked Emitters	900	576
QSO MGII Line Shifts	70	62
Hypervariable Quasars	1555	1237

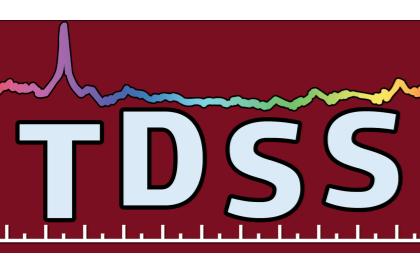
(Target Selection Details in MacLeod et al. 2018)



TDSS/SES update (through DR14)

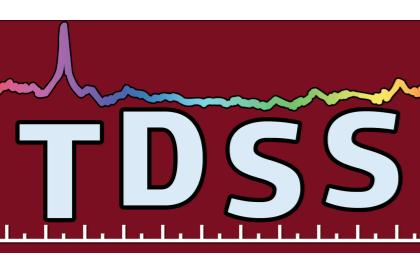
STAR subclasses (pipe) range from O/B, through A/F (green), to K/M (orange/red). Flaring M stars dominate, but thousands are in A/F-star regime that includes pulsating RR Lyrae. >710 have cataloged periodic light curves, e.g., also includes eclipsers. Large symbols highlight ~60 each CVs (purple x's) & variable WDs (blue +'s).



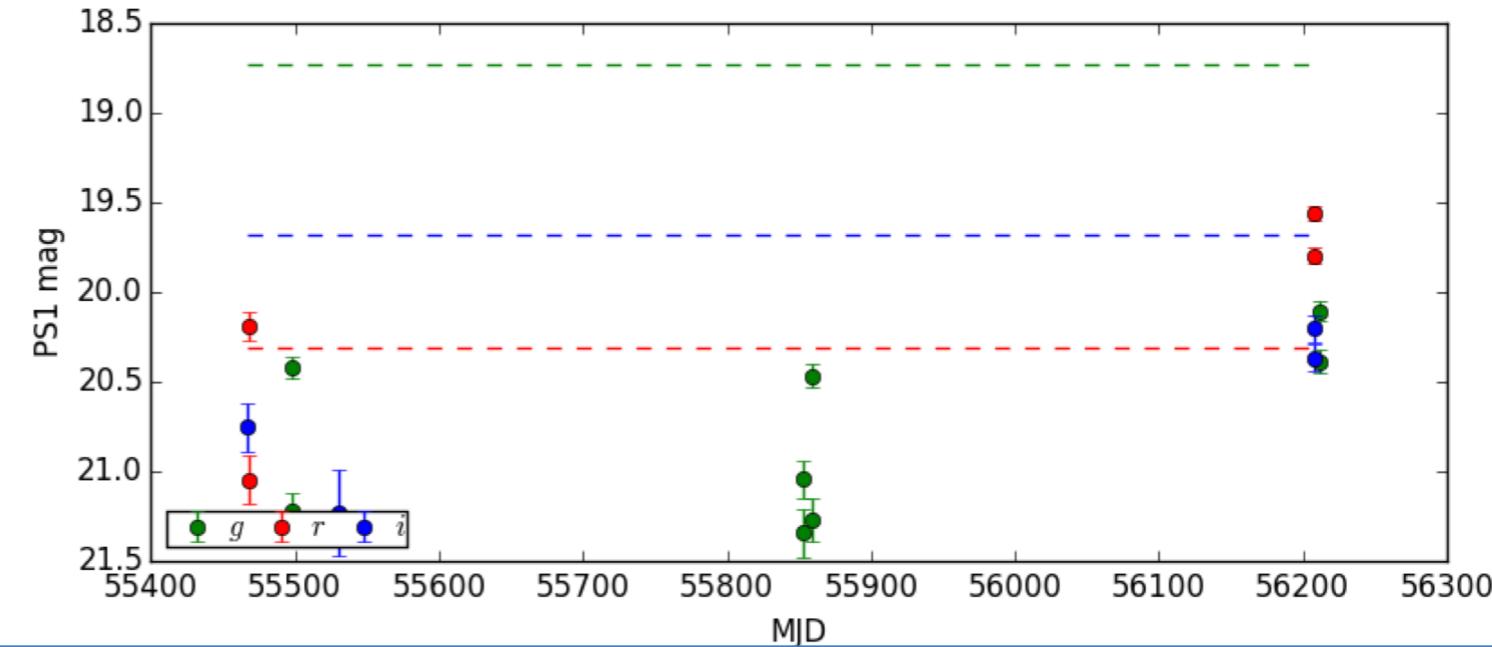
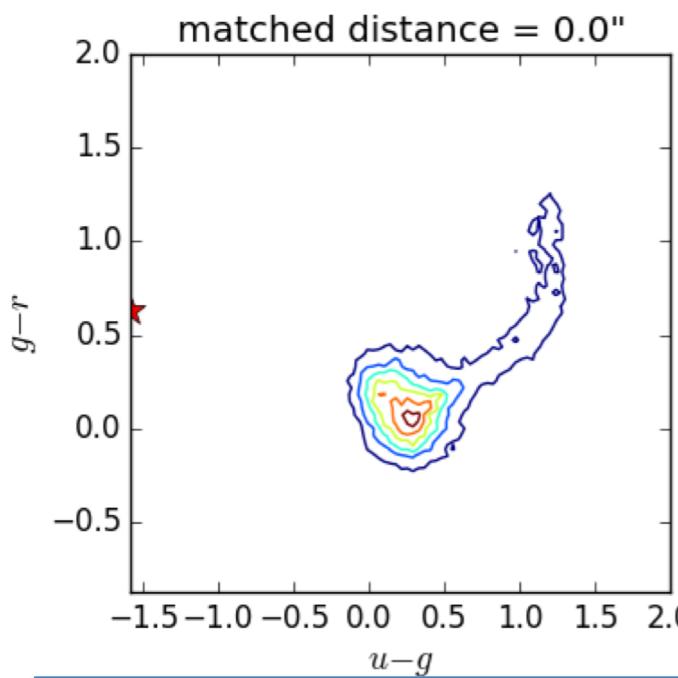
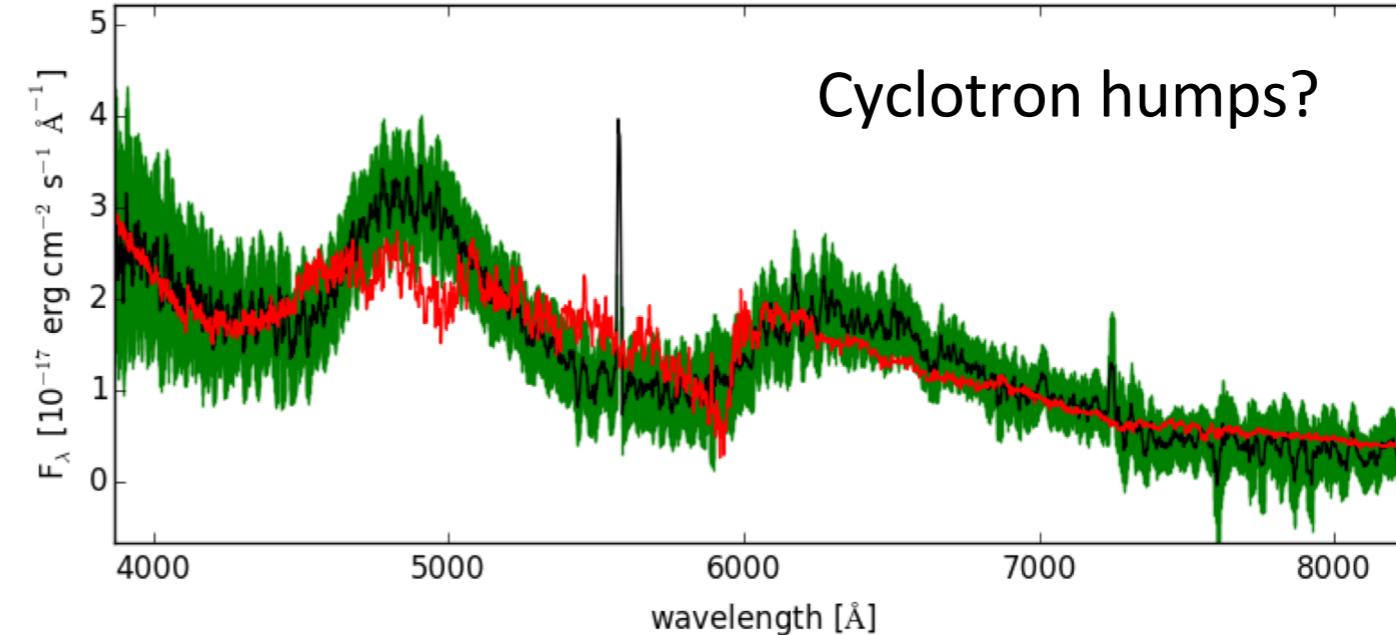
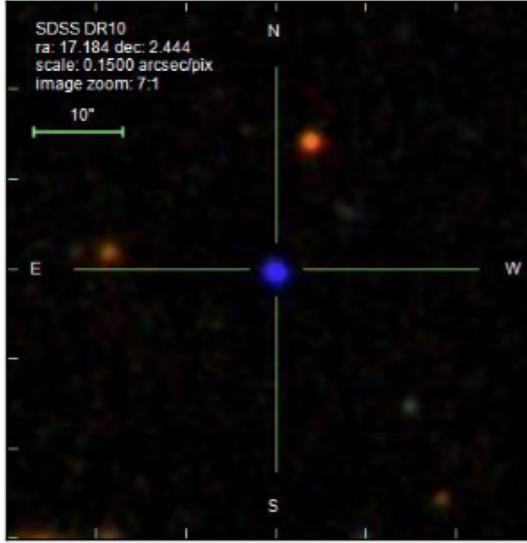


TDSS Stellar Science Opportunities

- Expect ~25,000 stellar variables in TDSS (pulsating, eclipsing, accreting, active)
 - ~ 4,000 off the main sequence
 - ~ 1,000 RR Lyr
 - ~ Handful of
 - WDs
 - CVs
 - Carbon stars
- ~10% of variables are periodic ($\log\text{Prob} < -10$)

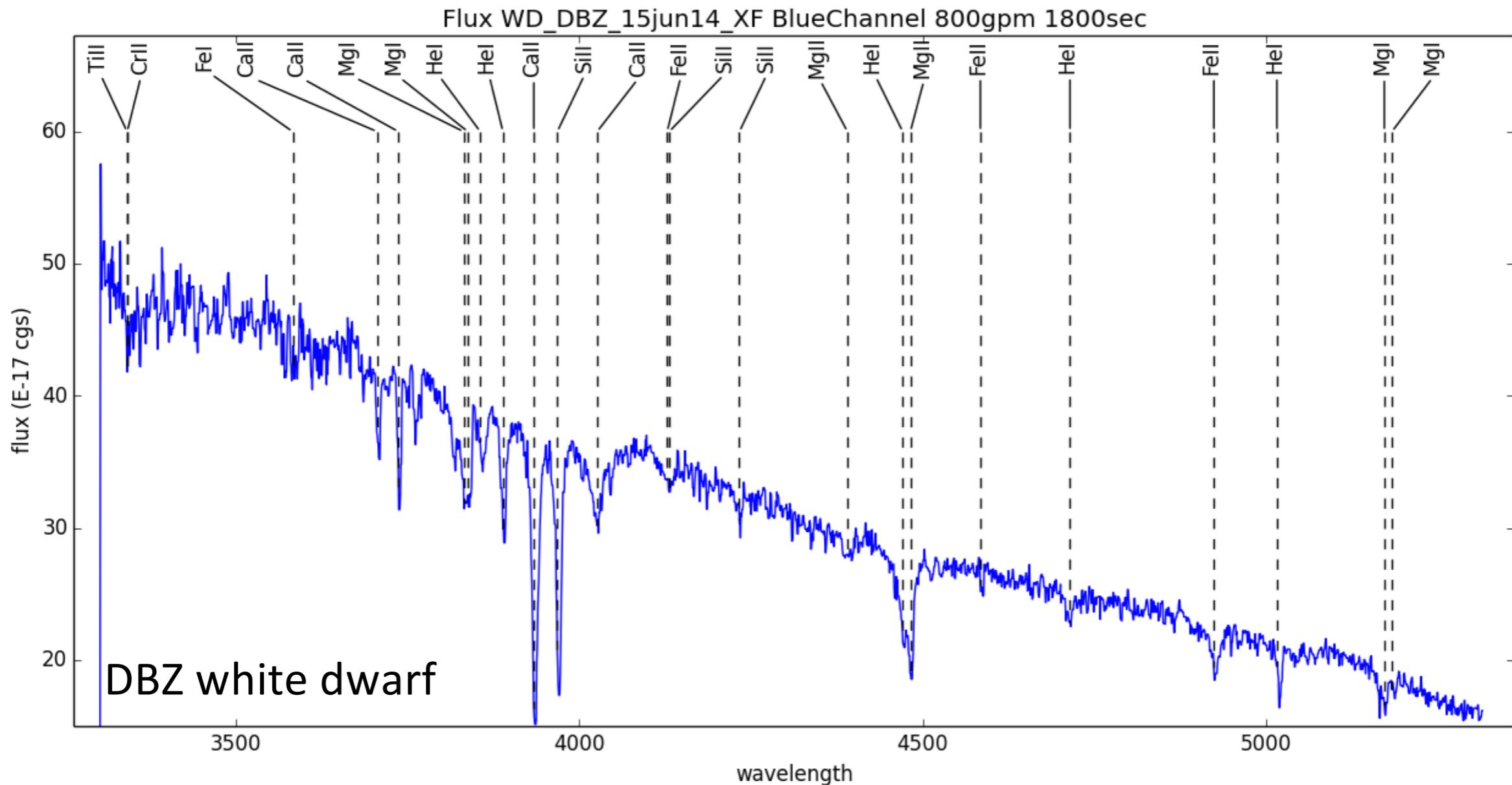


TDSS Stellar Exotica: LARP?

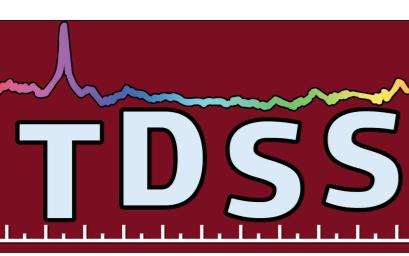


Low accretion rate polar? Highly variable. GALEX detected.

TDSS Stellar Exotica: DBZ WDs



6.5m MMT followup spectrum. Analysis pending via EC Dufour.

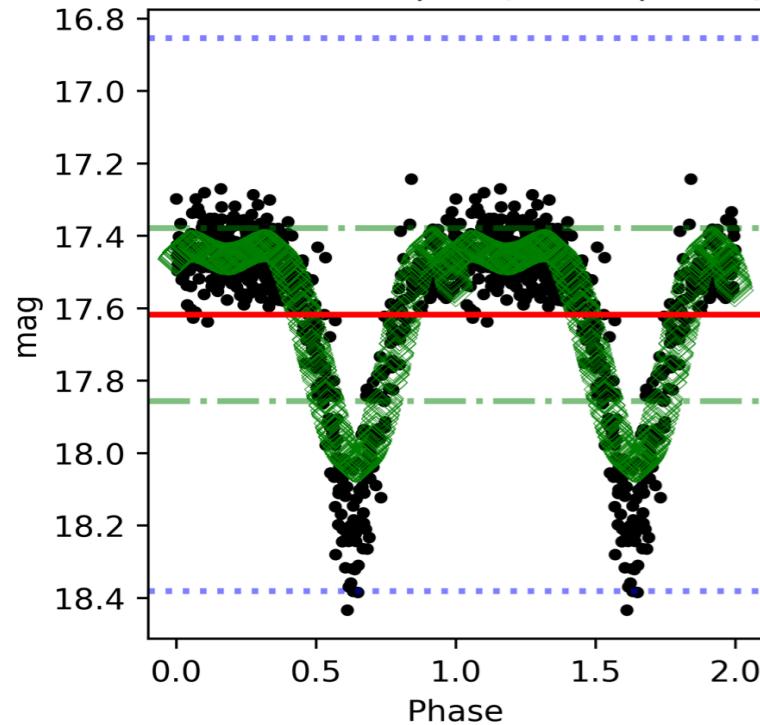


Expected Periodic Stellar Variable Types to $r < 18.5$ (*Drake et al. 2014, ApJ, 213, 1*)

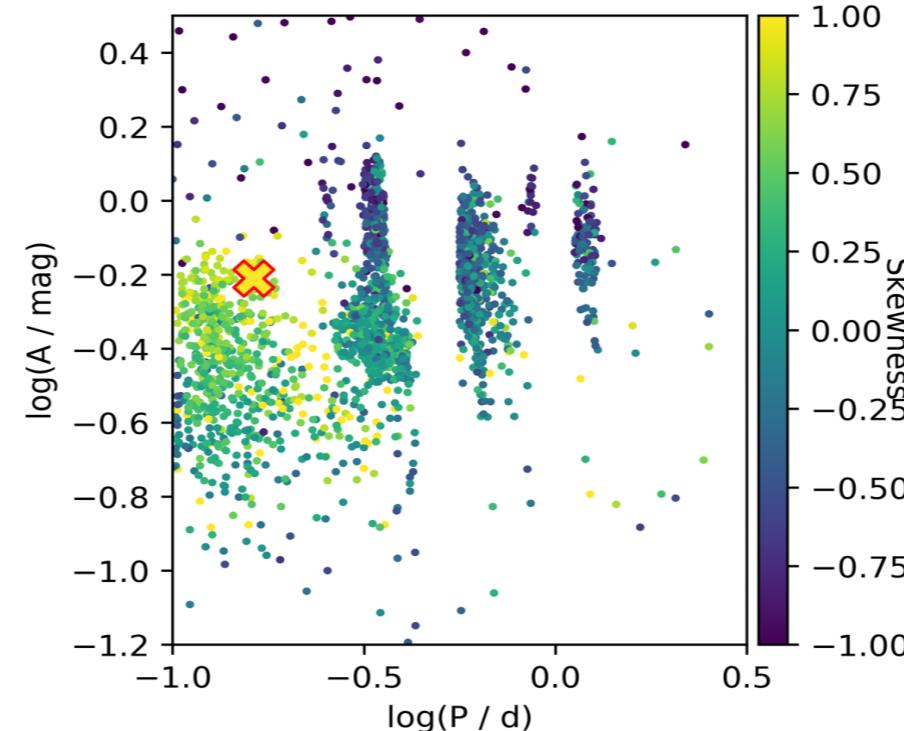
Type	Percent	Description
Eclipsing:		
EW	50.5	contact eclipsing binary
EA	7.6	detached (Algol) eclipsing binary
beta Lyrae	0.5	semi-detached eclipsing binary
RR Lyr:		
RRab	27.3	RR Lyrae (fundamental mode pulsators)
RRc	8.9	RR Lyrae (multi-period pulsators)
RRd	0.8	RR Lyrae (both)
Blazhko	0.4	RR Lyrae (quasi-periodic)
CEPHEID:		
ACEP	0.1	anomalous Cepheid
Cep-II	0.2	type II Cepheid
HADS	0.4	high amplitude delta Scuti
MISC:		
RSCVn	2.5	spotted rotator
LPV	0.8	Mira or semi-regular AGB variables

CSS ID: | P = 0.163
 logProb=-89.964 | Amp= 0.616
 ngood=530 | nreject=2
 nabove=42 (7%) | nbelow=93 (17%)

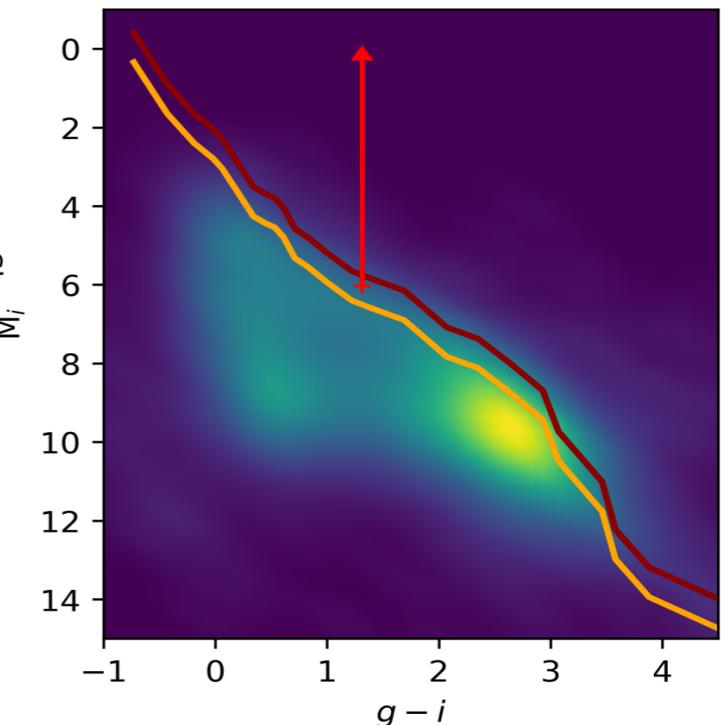
Drake: P=0.325056 | Amp=0.8 | VarType=EA



$\log_{10}(P / \text{day}) = -0.79$
 $\log_{10}(\text{Amp} / \text{mag}) = -0.21$
 Skewness = 1.31



$M_i = 6.03$
 $g-i = 1.31$
 UpperLim Dist = 23185 pc
 LowerLim $M_i = 0.3$

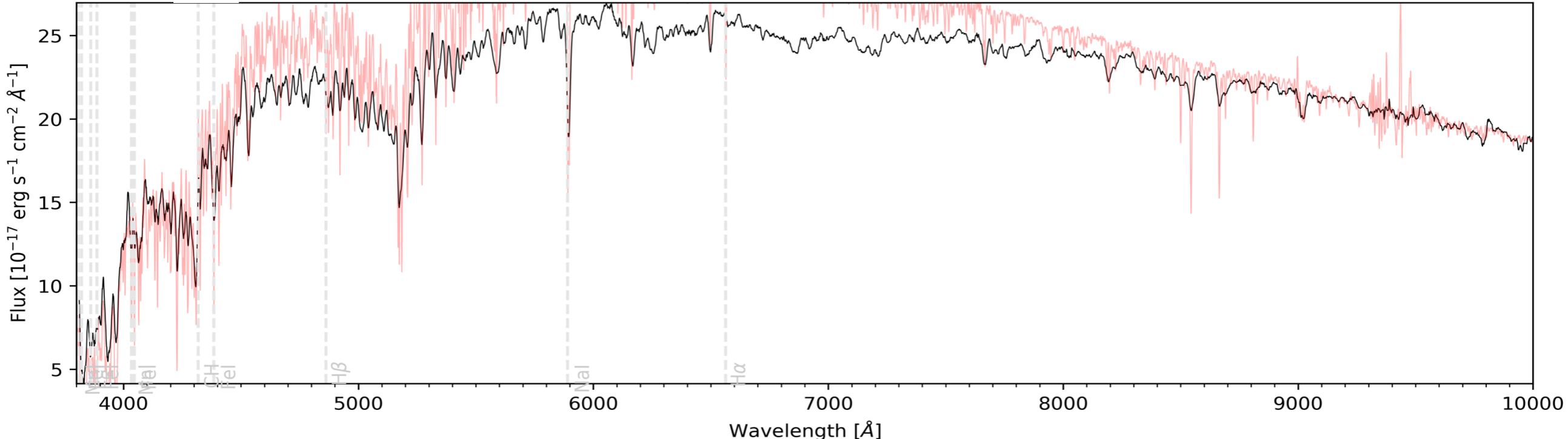


RA:

, DEC:

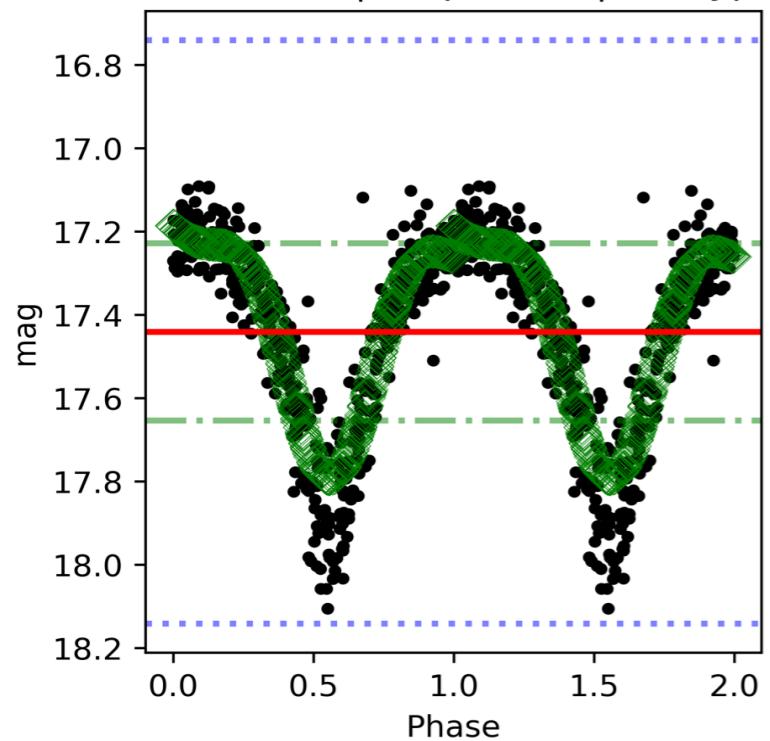
| cz = $60.92 \pm 4.32 \text{ km s}^{-1}$ | SDSS Subclass = K3V
 PyHammer = K4, RV = 100.26 km s^{-1}
 | GaiaDR2 Dist = 1659 pc (SNR = 3.64) | GaiaDR2 PMtot = 5.38 mas/yr (SNR = 26.81)

prop. | Plate = MJD = Fiberid =

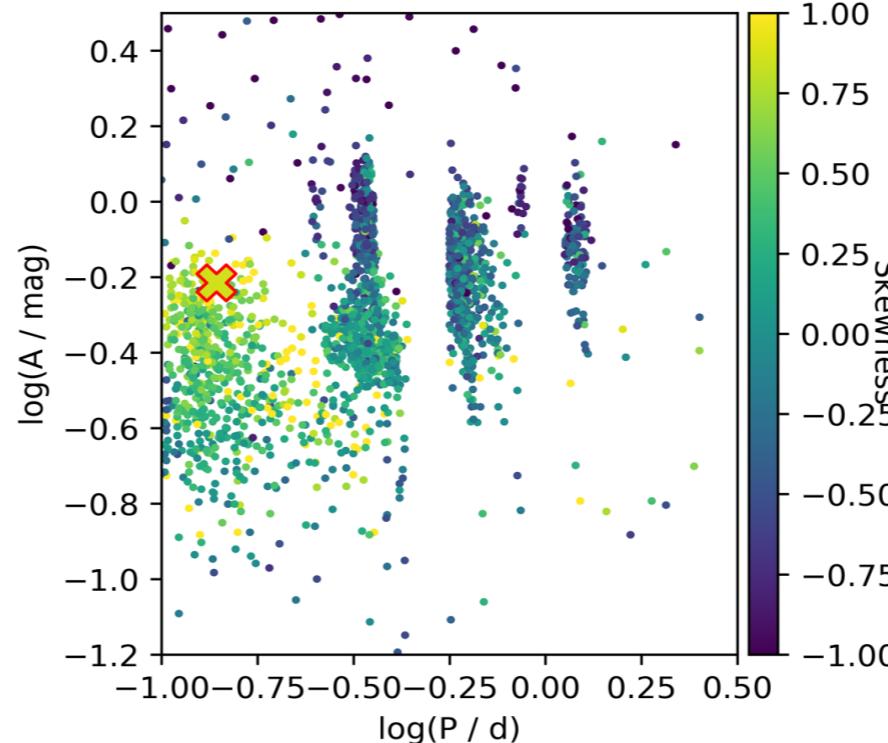


CSS ID: | P = 0.139
 logProb=-131.996 | Amp = 0.610
 ngood=466 | nreject=4
 nabove=75 (15%) | nbelow=96 (20%)

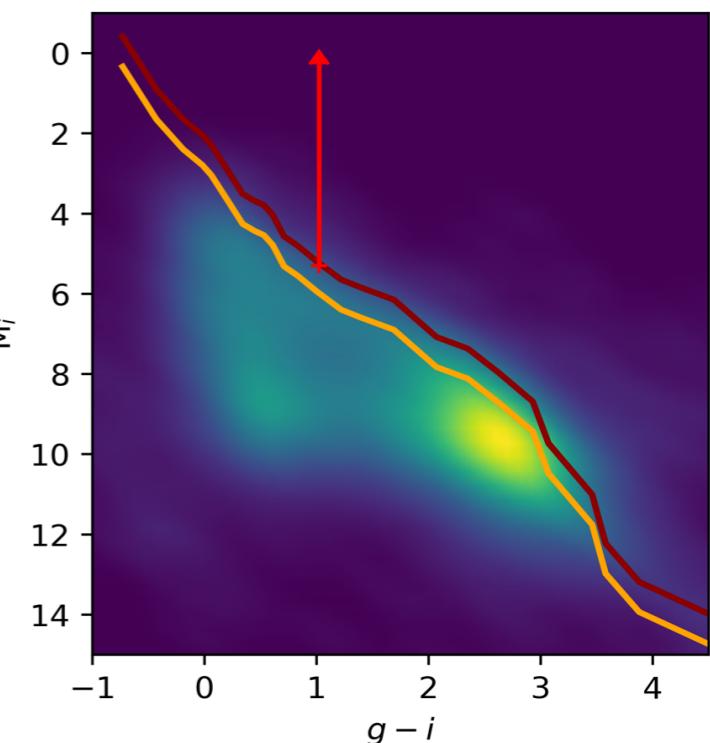
Drake: P=0.278904 | Amp=0.74 | VarType= β \Lyrae



$\log_{10}(P / \text{day}) = -0.86$
 $\log_{10}(\text{Amp} / \text{mag}) = -0.21$
 Skewness = 0.86



$M_i = 5.31$
 $g-i = 1.02$
 UpperLim Dist = 22511 pc
 LowerLim $M_i = 0.28$



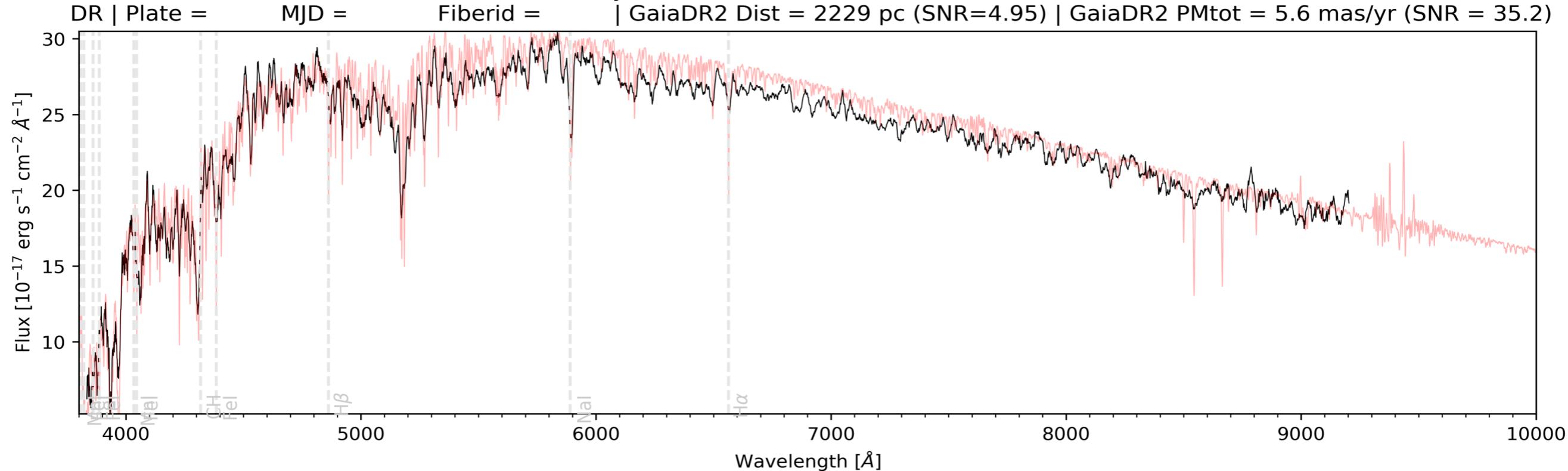
RA:

DEC:

$cz = 0.0 \pm 0.0 \text{ km s}^{-1}$ | SDSS Subclass = None

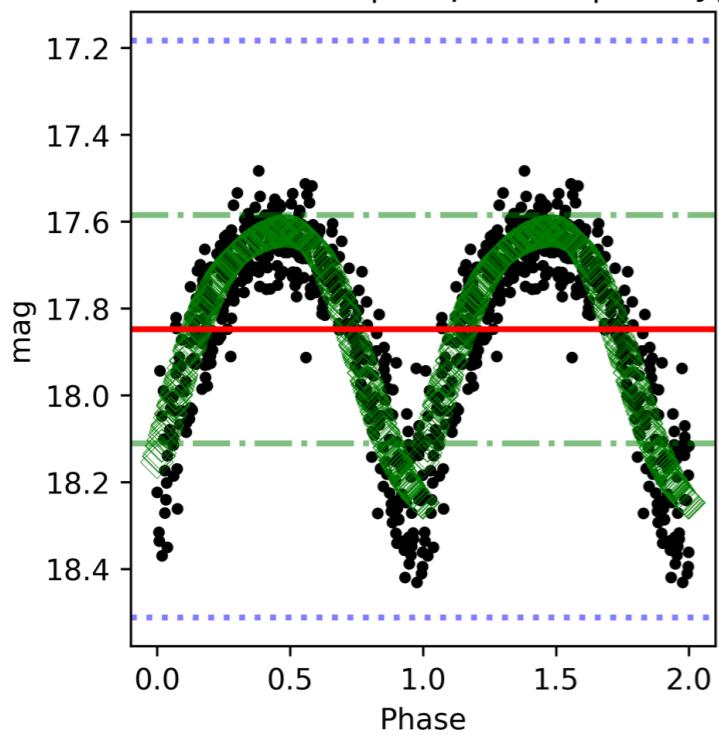
PyHammer = K3, RV = -51.87 km s^{-1}

| GaiaDR2 Dist = 2229 pc (SNR=4.95) | GaiaDR2 PMtot = 5.6 mas/yr (SNR = 35.2)

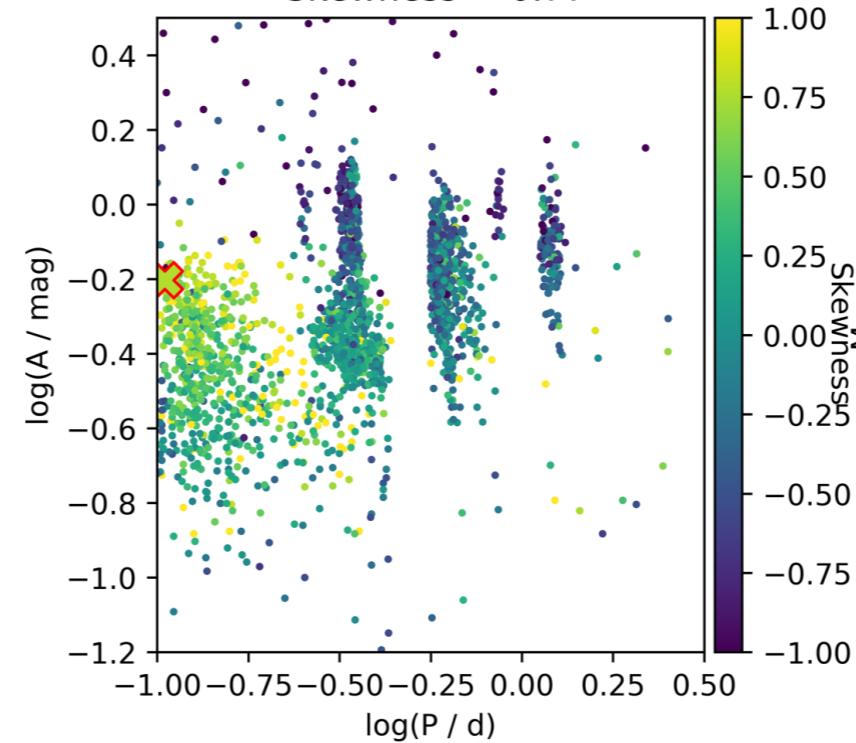


CSS ID: P = 0.105
 logProb=-148.751 | Amp= 0.627
 ngood=433 | nreject=3
 nabove=23 (5%) | nbelow=69 (15%)

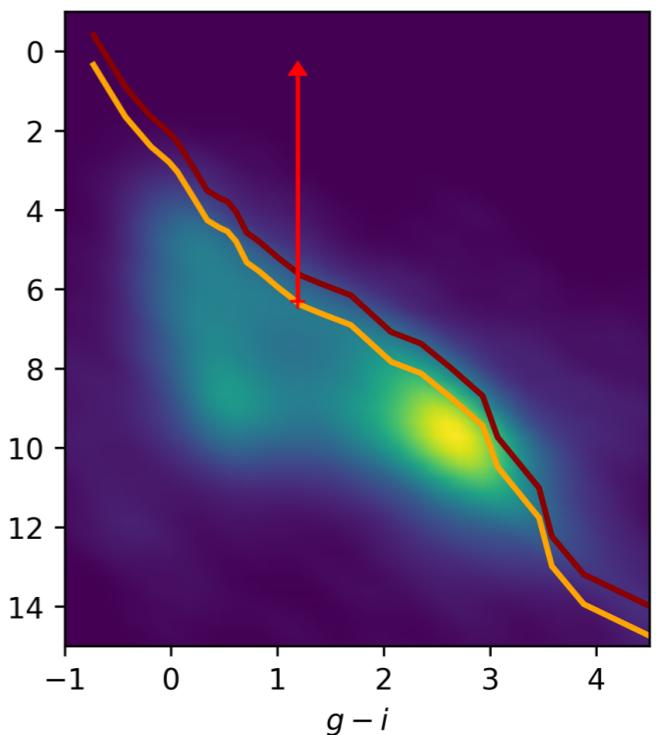
Drake: P=0.210378 | Amp=0.53 | VarType=EW



$\log_{10}(P / \text{day}) = -0.98$
 $\log_{10}(\text{Amp} / \text{mag}) = -0.2$
 Skewness = 0.77



$M_i = 6.3$
 $g-i = 1.19$
 UpperLim Dist = 21712 pc
 LowerLim Mi = 0.61



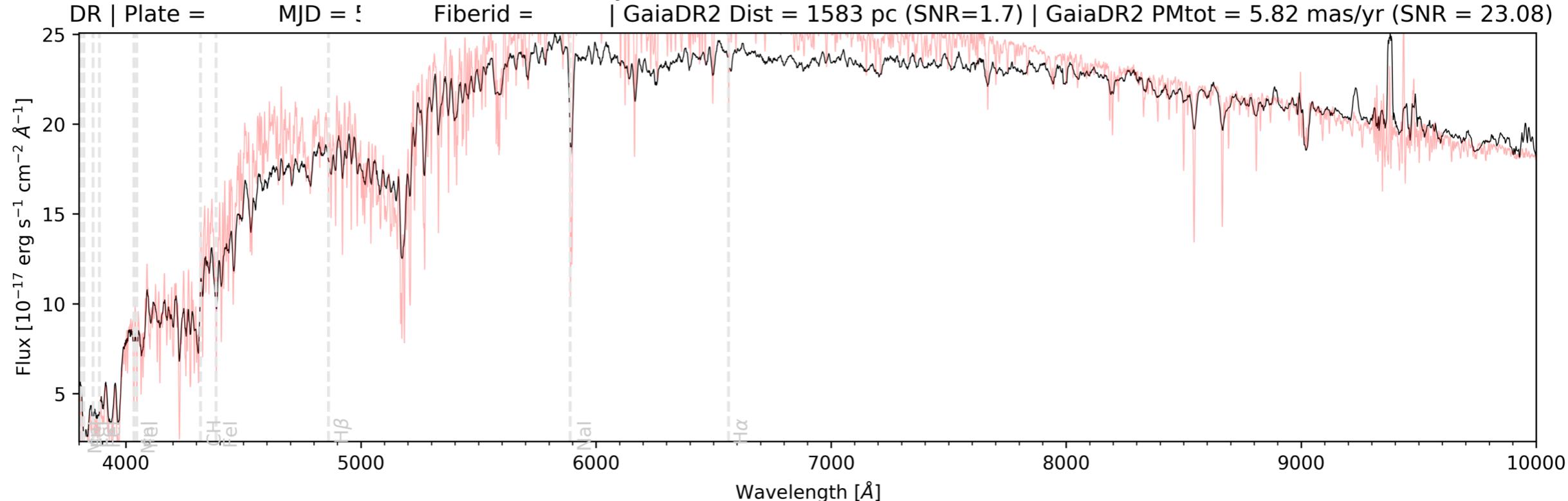
RA:

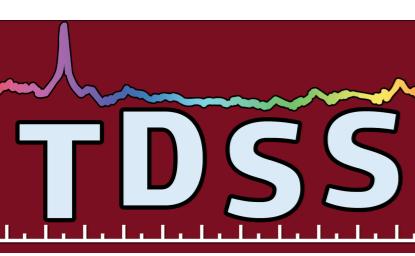
DEC: -

$z = 14.73 \pm 6.52 \text{ km s}^{-1}$ | SDSS Subclass = K5Ve

PyHammer = K5, RV = -35.23 km s⁻¹

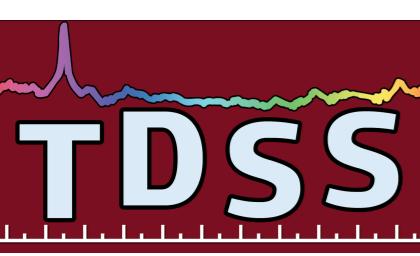
| GaiaDR2 Dist = 1583 pc (SNR=1.7) | GaiaDR2 PMtot = 5.82 mas/yr (SNR = 23.08)





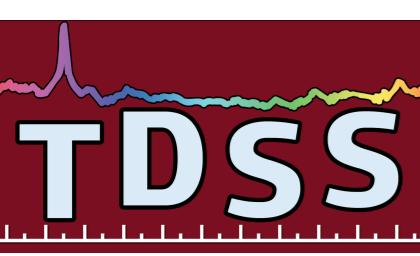
TDSS Stellar Science Opportunities

- 1000 RR Lyr w/RVs and metallicity estimates, could help identify streams
- Flare stars
- Active WD+dM systems
 - Follow FES dC paper and get separations
 - new post-CE?
 - Statistically examine the activity variation of close pairs as a function of spectral type, measure the white dwarf cooling age, and (possibly the) metallicity of the system
- **identify SB2s within the sample**

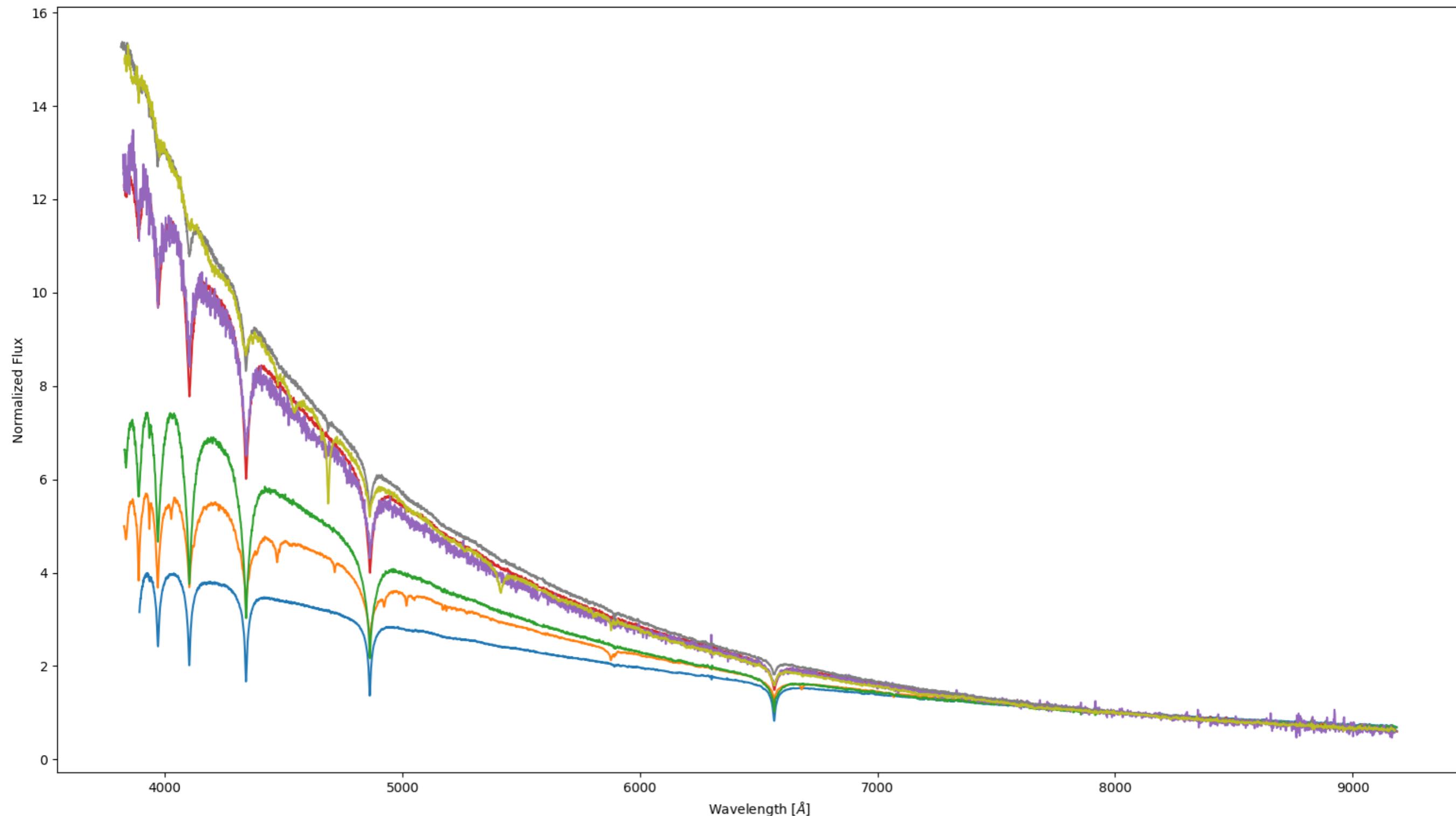


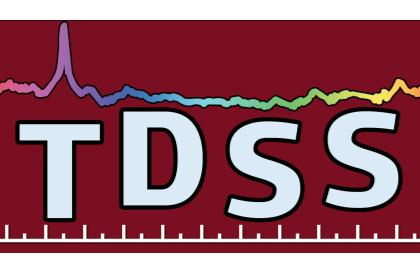
PyHammer & Extension

- PyHammer ([Kesseli et al. \(2017\)](#), <https://github.com/BU-hammerTeam/PyHammer>)
- Add additional C and WD templates (from TDSS)
- Developing tool to identify SB2s within the sample
 - Stellar templates from: A (Pickles+1998)
FGKM (MaStar, Yan+2018)
WD (Levenhagen+2017)

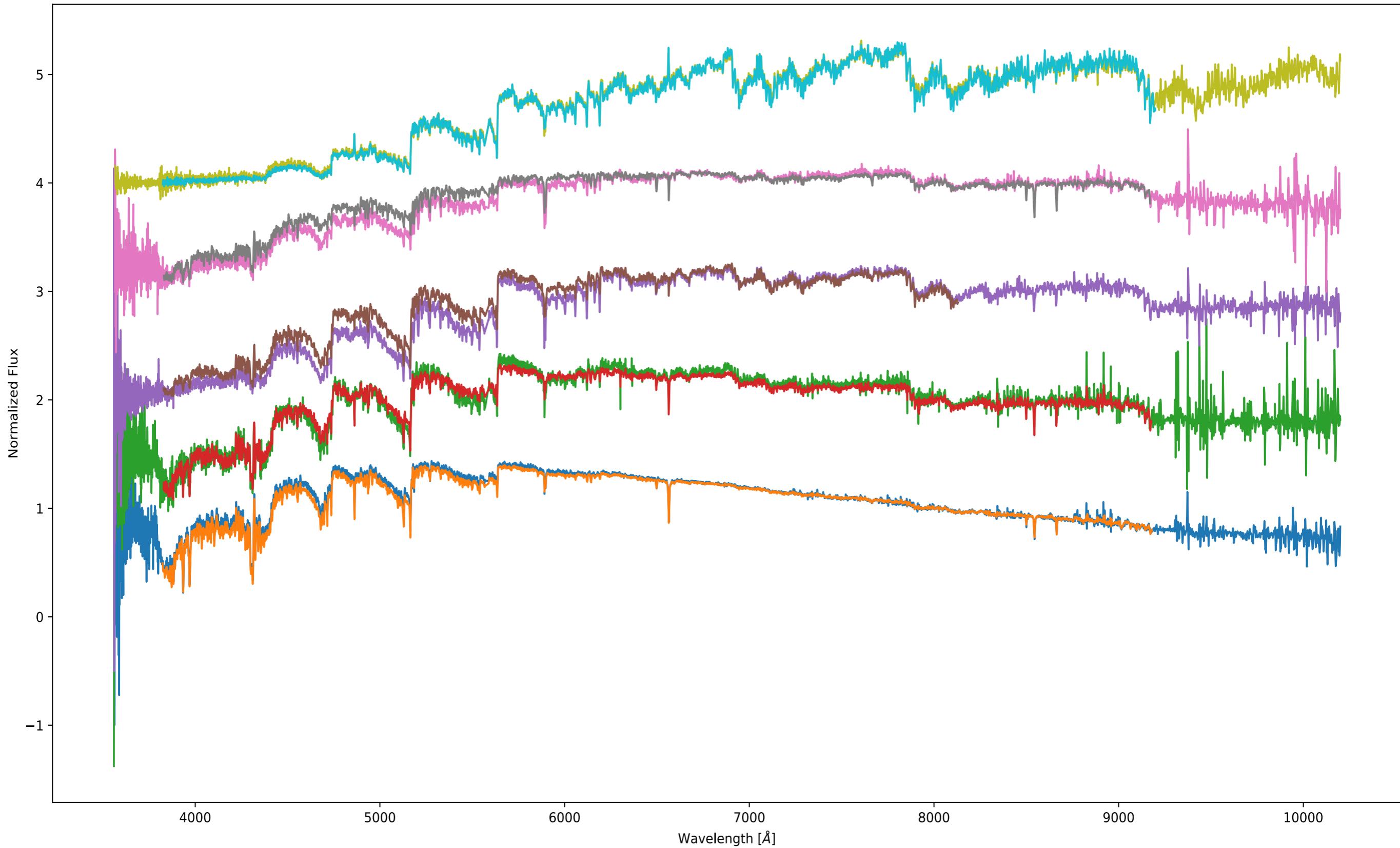


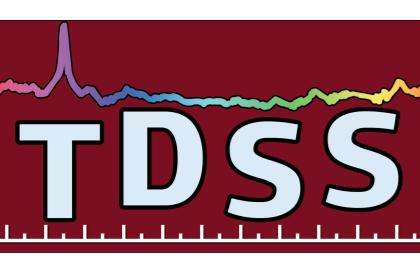
TDSS PyHammer WDs





TDSS PyHammer Carbon Stars

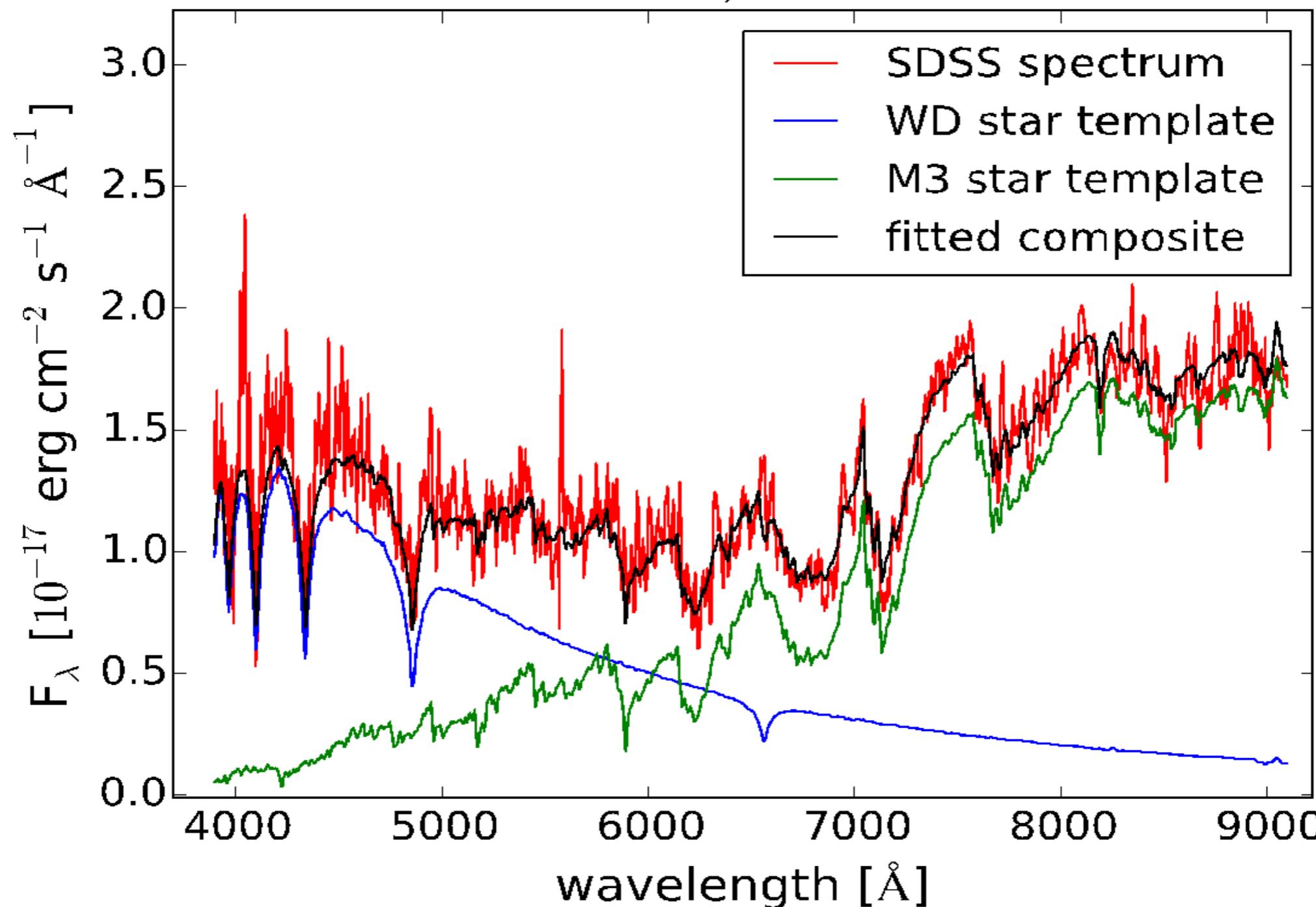


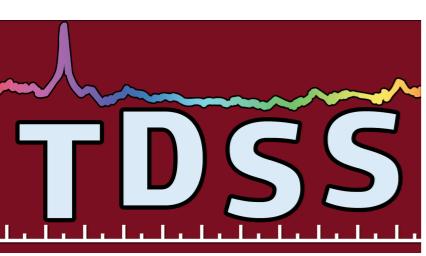


Composite-spectrum Binaries (a.k.a. SB2)

Can sometimes be obvious!

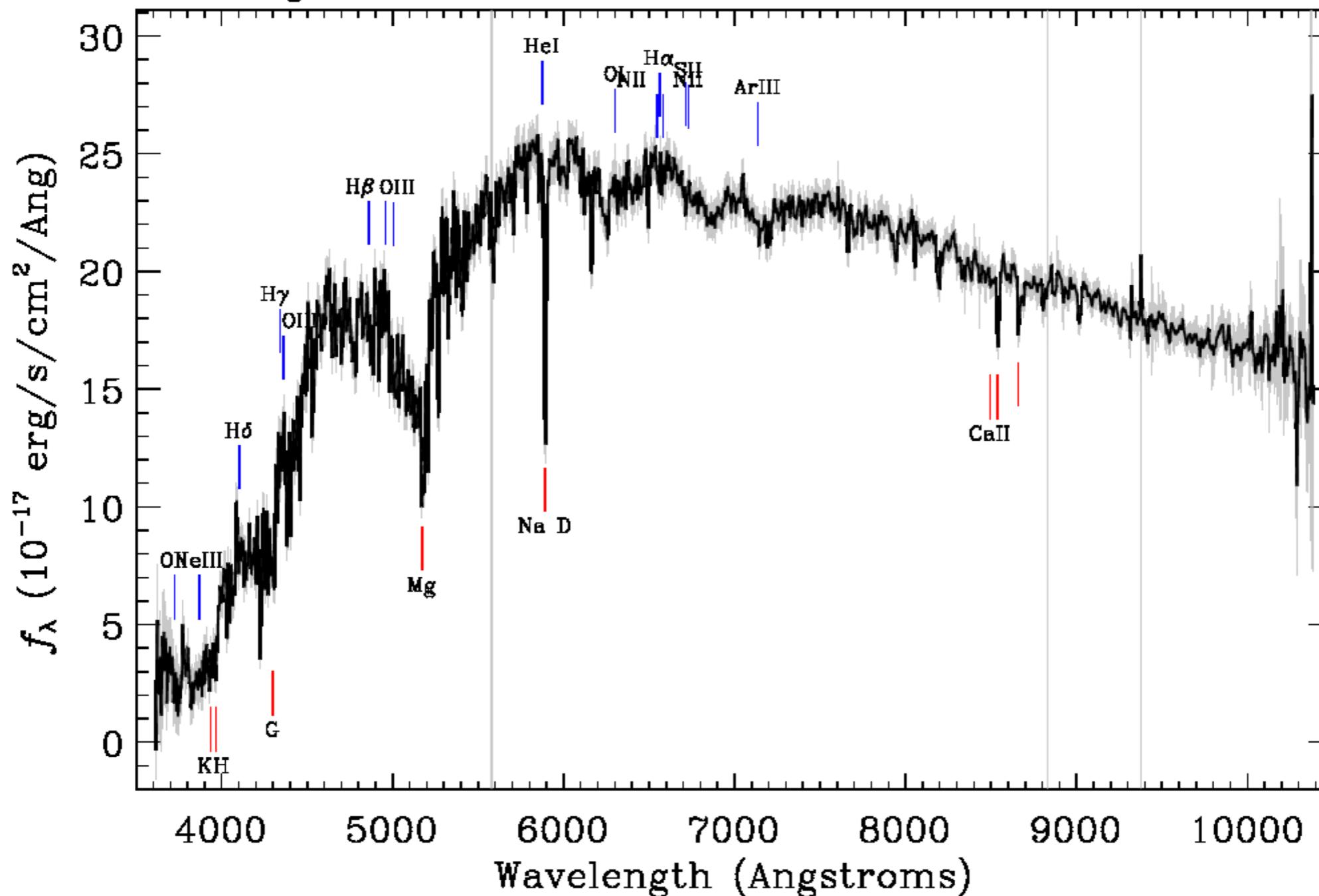
plate = 7413, mjd = 56769, fiber = 392
ra = 194.2458, dec = 45.89605

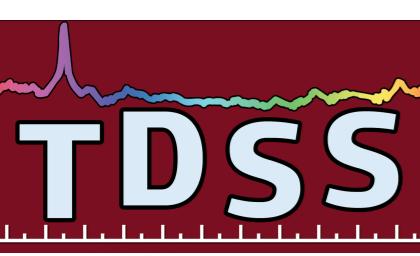




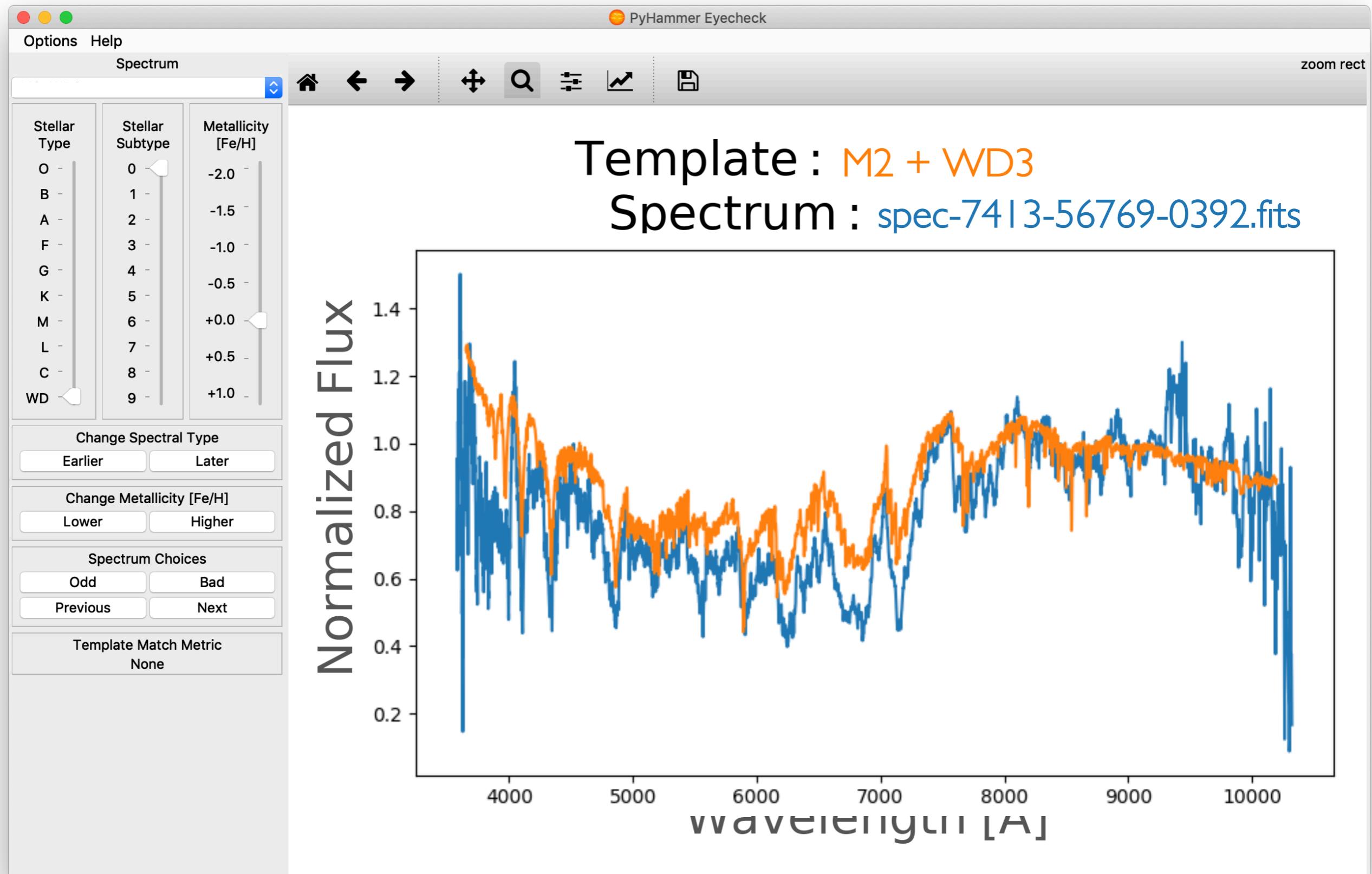
More Typical Composite-Spectrum Binaries

Survey: *eboss* Program: *eboss* Target:
RA=4.89498, Dec=26.38896, Plate=7662, Fiber=646, MJD=57358
 $cz=-88 \pm 3$ km/s Class=STAR K5Ve (118100)
No warnings.





PyHammer SB2 Extension

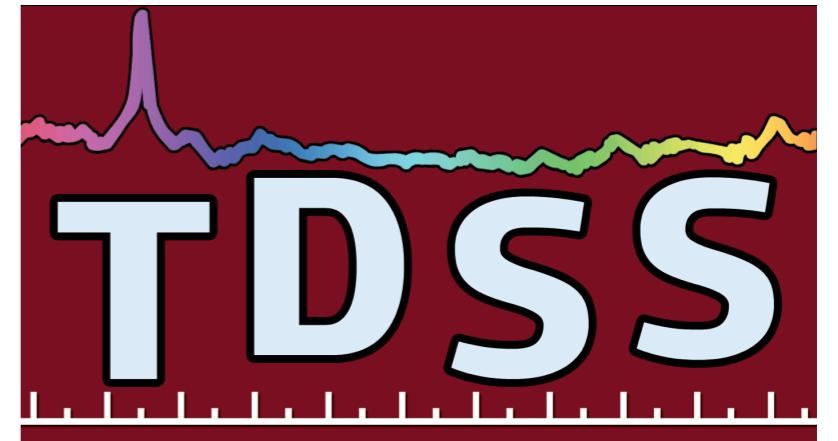


TDSS WIKI

<https://trac.sdss.org/wiki/TDSS>

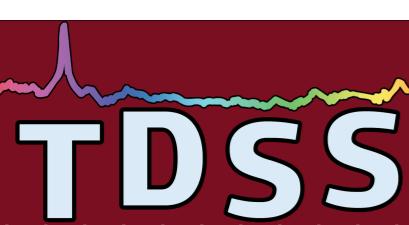
- Telecon number/minutes
- Documents and brief primer
- Instructions/software info for VIP (Ruan et al.)
- spAllTDSS file (an spAll file for TDSS targets, with SDSS-IV spectro pipeline parameters): **spAllTDSS-v5_10_01Jul2018_v0.txt**
- PS1/SDSS-IV data-sharing file

TEAM



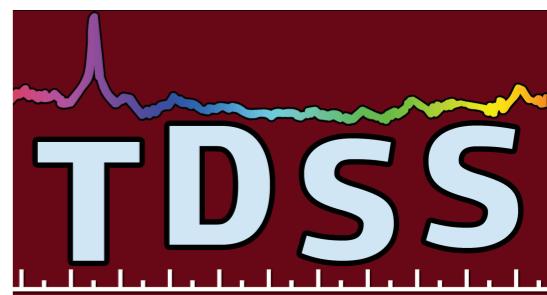
S. Anderson (UWa), C. Badenes (UPitt), M. Bershadsky (UWi), M. Blanton (NYU), N. Brandt (PSU), K. Chambers (IfA), J. Davenport (UW), K. Dawson (Utah), M. Eracleous (PSU), N. Filiz Ak (Erciyes), P. Garnavich (Notre Dame), A. Georgakakis (MPE), P. Green (CfA), J. Greene (Princeton), C. Grier (PSU), P. Hall (York), S. Hawley (UW), N. Kaiser (IfA), J.-P. Kneib (EPFL), C. MacLeod (CfA), Vivek Mariappan (PSU), I. McGreer (UA), A. Merloni (MPE), E. Morganson (UIUC), A. Myers (UWy), I. Paris (IAP), B. Roulston (SAO/BU), J. Ruan (McGill), J. Runnoe (UMich), M. Salvato (MPE), E. Schlaufly (MPIA), D. Schlegel (LBNL), S. Schmidt (AIP), D. Schneider (PSU), Axel Schwone (AIP), B. Sesar (Caltech), T. Shanks (Durham), S. Smartt (Queen's U. Belfast), K. Stassun (Vander.), P. Szkody (UWa), J. Tonry (IfA), F. Walter (MPIA), D. York (UC), ... YOUR NAME
HERE

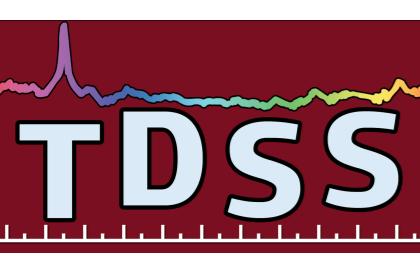
EXTRA SLIDES



TDSS Spectroscopic Data: Early 2019

- From recent spAll TDSS file for SDSS-III+SDSS-IV (spans from earliest TDSS targets on SDSS-III SEQUELS plates, through January 2019 SDSS-IV plates).
Approx numbers:
- 1350 good-quality plates, with more than 10^5 TDSS spectra taken through January 2019 (including ~77k of quasars)
- 103,700 SES selected or co-selected targets (not including archival)
 - 17,400 TDSS_A (SEQUELS pilot, but very similar algorithm)
 - 42,400 TDSS_B (Morganson et al. 2015 final algorithm)
 - 43,900 TDSS_CP (""; most also chosen by eBOSS core)
- 56,200 are quasars (~54% of SES targets)
- 6,500 FES targets, including 4700 FES quasars (~72% of FES)
- 16,500 RQS targets, all quasars





TDSS Stellar Science Opportunities

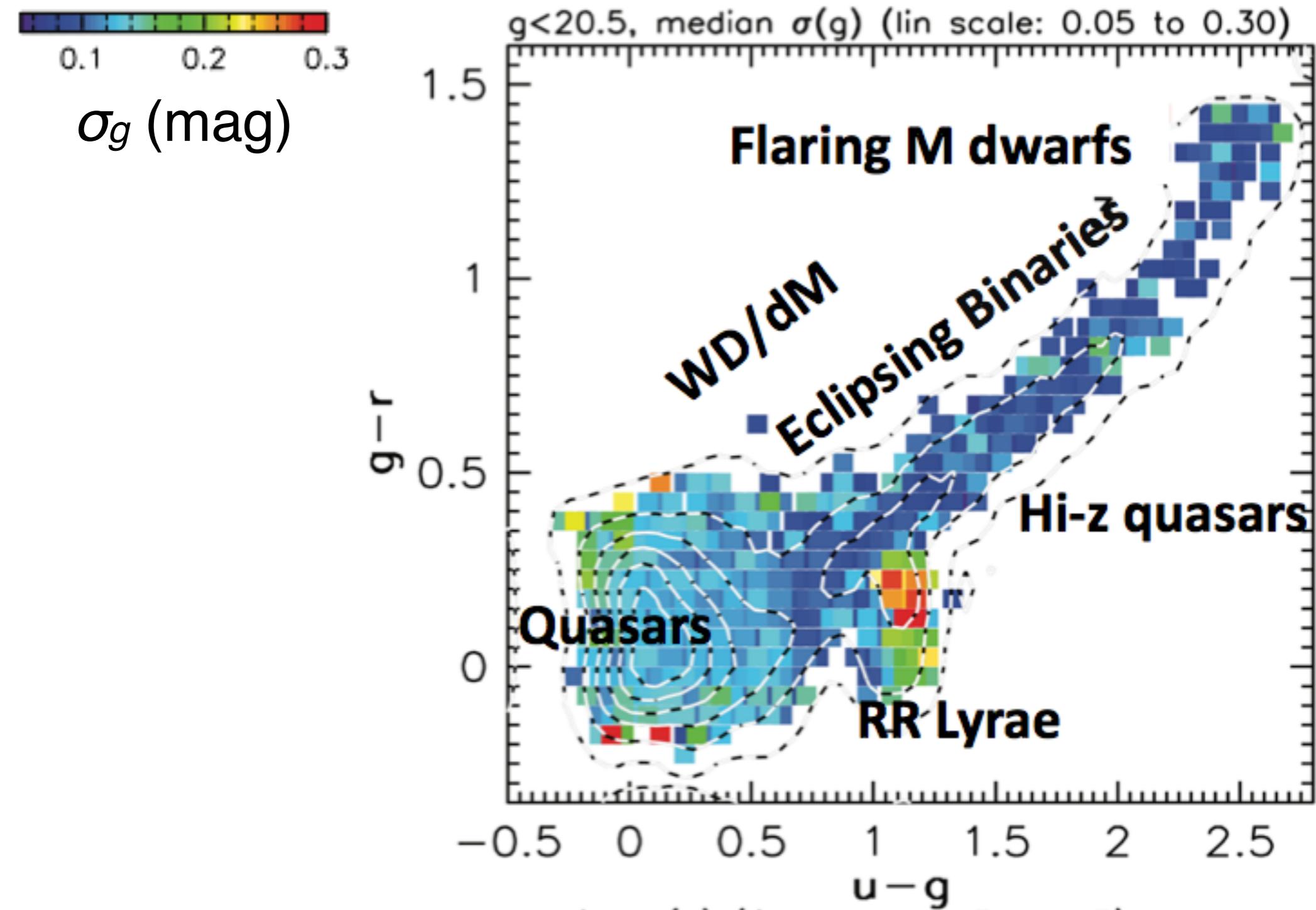
- Classify all variables with RF/Clustering algorithms
 - Light curve statistical features:
 - e.g. ChiSq, amplitude, period, skew, flare detection
 - Gaia DR2 parallax and proper motion
 - Spectroscopy provides:
 - Spectral type and emission line activity
 - RV for kinematics (with Gaia DR2 parallax & proper motions)
 - T_{eff} , sometimes logg and metallicity estimates
 - SB2 probability?

TDSS TECHNICAL DETAILS

- eBOSS subprogram in SDSS-IV (2014 - 2020; Blanton et al. 2017)
- Targets selected as variables from SDSS and Pan-STARRS1 (PS1)
- ~140k new spectra + ~80k archival spectra
- 10 fibers deg⁻² on eBOSS spectrograph
- **Main Program:** single-epoch spectroscopy (“**SES**”)
 - 90K spectra for discovery/classification (Morganson et al. 2015)
- **Spectroscopic Variability:**
 - 10% fibers reserved for few-epoch spectroscopy (“**FES**”) programs
 - 12K Repeat Quasar Spectra (“**RQS**”) (MacLeod+2017)



CELESTIAL VARIABLES



*“Exploring the Variable Sky with the Sloan Digital Sky Survey,”
Sesar et al. (2007)*

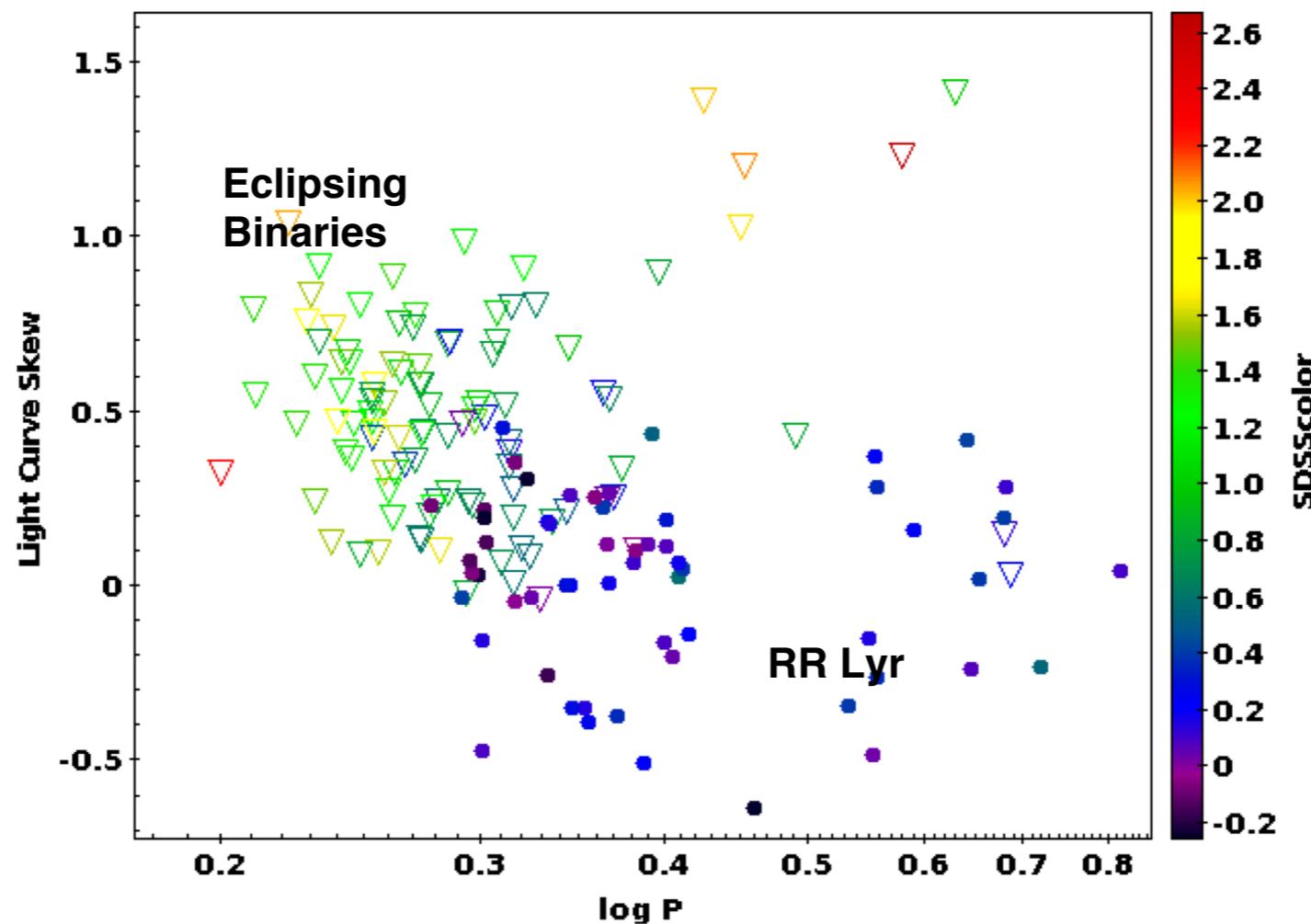
Sesar et al. 2007

PURITY

- Must be robust to bad measurements
- Precision: 0.1 mags
- Sample of variable objects expected to be 96% pure and comprising the following:
 - 8 deg^{-2} with existing SDSS spectra,
 - 10 deg^{-2} with new TDSS spectra, and
 - 15 deg^{-2} with new spectra from eBOSS.

Periodic Stars in TDSS

- Classify using: period, amplitude, skew, color & spectral type, Gaia parallax
- Spectroscopy provides
 - RV for kinematics (w/ Gaia parallax & proper motions)
 - $\log g$, T_{Eff} and metallicity estimates

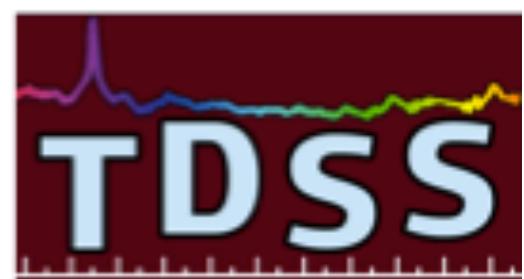


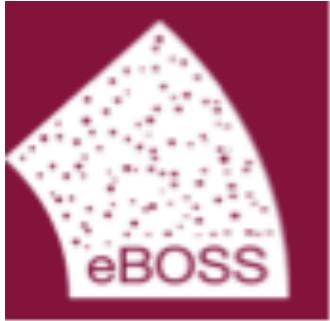


TDSS Spectroscopic Data: 2017 Update

- From a recent spAll TDSS file for SDSS-III+SDSS-IV (spans from earliest TDSS targets on SDSS-III SEQUELS plates, through latest SDSS-IV ELG plates):
 - 675 total good-quality plates taken through June 2017
 - 66618 SES targets selected or co-selected
 - 3266 FES targets
 - 2166 RQS targets
 - RQS (Repeat Quasar Spectroscopy)
 - 1443 RQSI
 - 344 RQS2
 - 29 RQS3
 - 176 RQS2v
 - 174 RQSv3
 - FES (Few Epoch Spectroscopy)

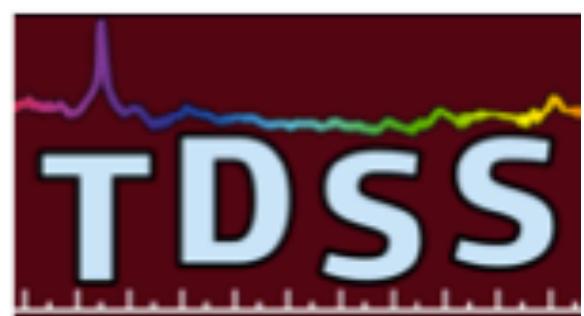
309 DE	195 ACTSTAR
526 HYPQSO	189 DWARFC
32 MGII	295 HYPSTAR
426 NQHISN	84 WDDM
1210 VARBAL	





TDSS Spectroscopic Data: 2017 (SES)

- SES (Single Epoch Spectroscopy of PSI variables)
 - 17,511 TDSS_A (SEQUELS pilot, but very similar algorithm)
 - 25,016 TDSS_B (Morganson et al. 2015 final algorithm)
 - 24,091 TDSS_CP (""; most also chosen by eBOSS core)
- Among the total 66,618 SES-relevant TDSS spectral targets
 - 34,726 quasars (many also TDSS_CP) ~ 52%
 - 29,603 stars (mainly TDSS) ~ 45%
 - 2,289 galaxies, unknowns, etc ~ 3%
- Full SES sample now large enough to include reasonable subsamples of unusual/rare classes, e.g., $\sim 10^2$ each of variable CVs &WDs, and ~ 30 C stars
- There are a further $\sim 6\text{-}8/\text{deg}^2$ spectra for additional TDSS/PSI photometric variables (mainly quasars) in the SDSS I-III archive (pre-SEQUELS,).
- So far from SDSS-IV, there are $\sim 35k$ TDSS-only spectra on-hand across SES, FES, and RQS (not counting TDSS co-selections w/ SDSS-IV fibers charged to others). This is $\sim 40\%$ of intended TDSS-only fiber allocation in SDSS-IV.



SES VARIABLE SELECTION

- $17 < i < 21$, unresolved sources
- Require 2* good bands (from among *griz*) in PS1, SDSS
- 3D Kernel Density Estimator

