#### **Pre-meeting Presentations**

Participants were requested to provide ahead of the meeting. It is understood that all participants will diligently go through the presentations prior to coming to the meeting (preferably not on the meeting-bound airplane!). You have a choice of either viewing a <u>consolidated file</u> or individual files (below).

- 1. Fruitful returns from cadenced RV observations with SDSS (Badenes).
- 2. Introduction to ZTF: Surveys & Performance (Bellm). Presents the performance of ZTF and summarizes the surveys. Useful if you wish to use ZTF.
- 3. Finding interesting binaries from Gaia (Brandt).
- Double Degenerates discovered with ZTF (Burdge).
   ZTF has discovered a clutch of short period detached eclipsing binaries some of which are the loudest signals for the LISA mission.
- 5. AGN Light curves (Graham).
- 6. <u>ZTF as a modern time domain astronomy public survey</u> (Graham). ZTF is unique in putting out LSST style, machine friendly, alerts.
- 7. Pulsating white dwarfs (Hermes).
- 8. <u>TDA surveys and young stars</u> (Hillenbrand).
- 9. <u>The era of NRA TDA surveys begin.</u> (Kasliwal).
- Hot results from cool transients 10. <u>SDSS Phase V</u> (Kollmeier).
  - The next phase of SDSS aimed at "dynamic highly multiplexed stellar and interstellar" spectroscopy.
- 11. Other Exotic Stellar Binaries from ZTF (Kupfer).
- 12. Light Curves from TESS (Oelkers).
- Light curves & data products from TESS. Includes description of pipelines.
- 13. Limits to ground-based photometry & astrometry (pre-LSST) (Ofek).
- 14. <u>ASAS-SN</u>(Shappee).
- 15. ATLAS (pdf) [ (ppt) (Tonry).
- 16. <u>Tomo-e Gozen Observations of Pulsars</u> (Ichicki).
- Observations of radio pulsars with sub-second framing Tomo-e-Gozen.
- 17. <u>Tome-e-Gozen (</u>Arima).
- The world's first wide-field sub-second framing optical camera (at Kiso Schmidt, Japan).
- 18. Application of Machine Learning for Stellar Binaries. (van Roestel).
- # For Unix aficionados:
- # Problem: how to automatically "build a book" from a website?
- # (you can have any ordering  $b\bar{y}$  using sort but here it is by alpha)
- # change directory where the pdf files are located
- \$ wkhtmltopdf ../PM\_Presentations.html AAATable.pdf
  \$ pdfunite \$(ls -1 \*.pdf | xargs) ../PM\_Presentations.pdf

# Fruitful returns from cadenced RV observations with SDSS

**Carles Badenes** University of Pittsburgh / PITT PACC

SDSS-V + ZTF OCIW, May 3-4 2019



- Goal: find as many short-period binaries as possible, in order to
  - Constrain multiplicity statistics in the field.
  - Identify interesting systems for follow-up.
- Radial Velocities from SDSS-IV and SDSS-V: cadences, errors, and challenges.
- Main results so far: multiplicity statistics for binary WDs and field stars, discovery of a detached BH binary.
- Synergies with other data sets: Gaia, ASASS-SN, ZTF, ...

• **Multiplicity Statistics** only known at all P in the MS and in the Solar Neighborhood [Duchene & Kraus 13, Moe & DiStefano 17].

• Studies in stellar clusters (small samples) [Carney+ 03; Geller+ 08; Matijevic+ 11; Sana+ 12; Merle+ 17], but **no panoramic view of the interplay between multiplicity, stellar evolution, and stellar properties in the field.** Open questions:

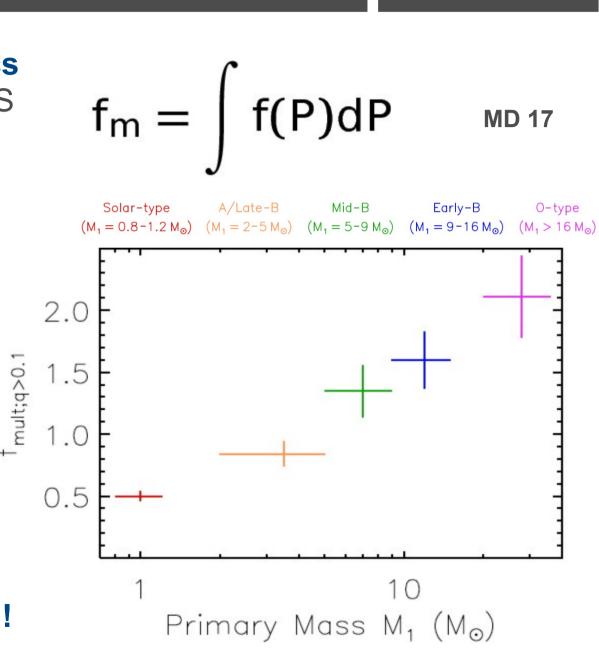
- Are our ideas about RLOF basically correct?
- Stellar multiplicity vs. stellar properties and environment: Mass, age, metallicity, disk/halo... ⇔ SF theory [Machida+ 09, Bate 14], dynamics [Kroupa & Petr-Gotzens 11].
- Rate of CE events in the MW? Rate of stellar mergers?
   Formation rate of short P systems? Can we help constrain BPS models for SNe, GW sources, etc.?

# What are we looking for?

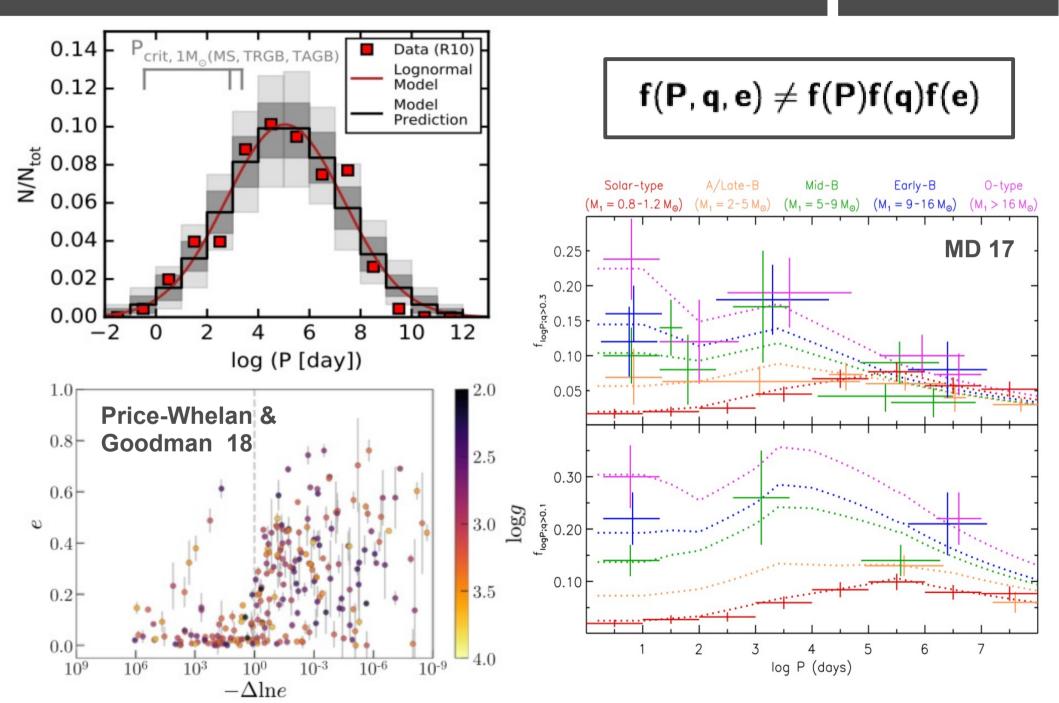
#### Carles Badenes SDSSV+ZTF

• Stellar Multiplicity Statistics (well measured for Sun-like MS stars, D<25 pc) [Raghavan+ 10, Duchene & Kraus 13, Moe & DiStefano 17 (MD17)]:

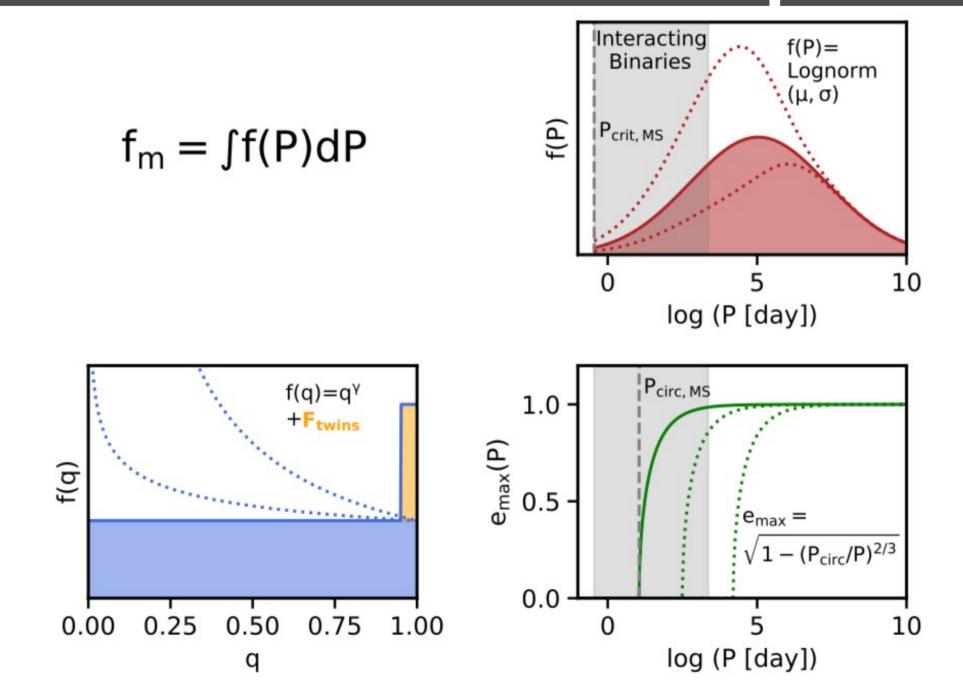
- Multiplicity frequency (f<sub>m</sub>): dominated by M<sub>1</sub>.
- Period (P): ~lognormal.
- Mass Ratio (q): ~flat, F<sub>twin</sub>.
- Eccentricity (e): tidal circularization, ~uniform.
- These statistics are not independent of each other!!!! [Sana+ 12, MD17].



# What are we looking for?



# What are we looking for?



# Multiplicity and Stellar Evolution

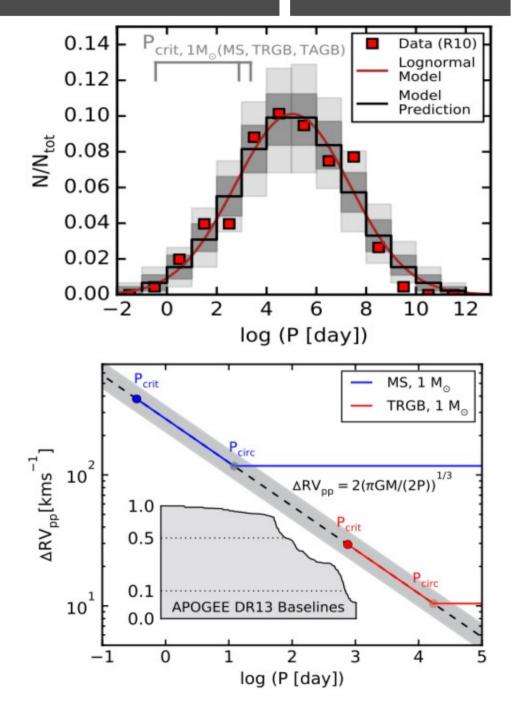
• Critical P for RLOF (q=1):

### $P_{crit} = 0.76(R^3/(GM))^{1/2}$

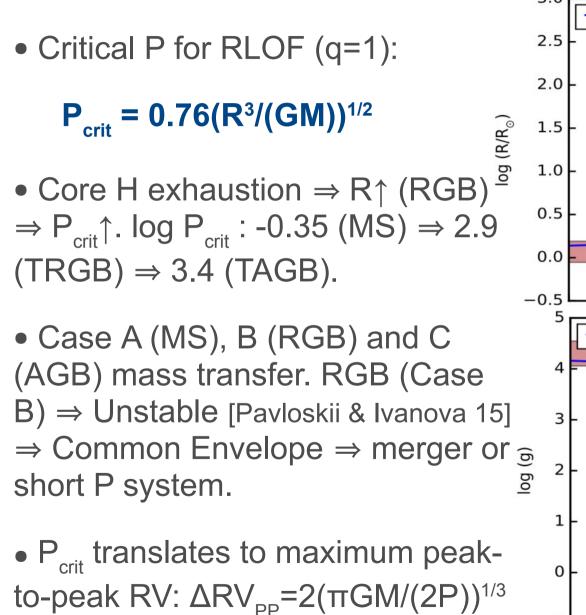
• Core H exhaustion  $\Rightarrow R\uparrow (RGB)$  $\Rightarrow P_{crit}\uparrow . \log P_{crit} : -0.35 (MS) \Rightarrow 2.9$ (TRGB)  $\Rightarrow 3.4$  (TAGB).

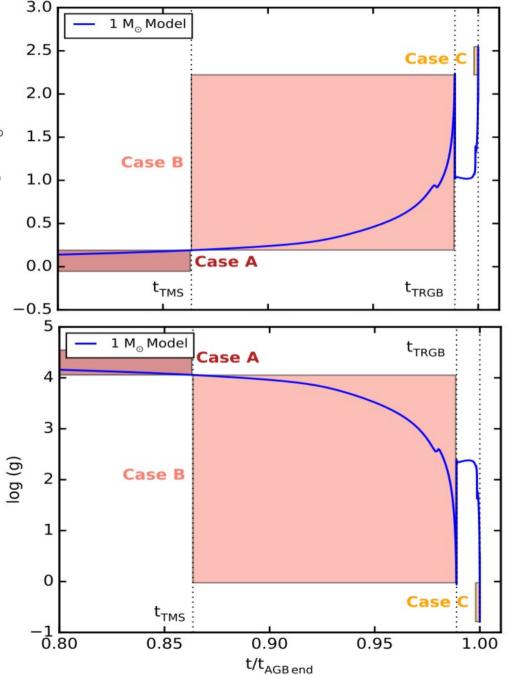
Case A (MS), B (RGB) and C (AGB) mass transfer. RGB (Case B) ⇒ Unstable [Pavloskii & Ivanova 15] ⇒ Common Envelope ⇒ merger or short P system.

•  $P_{crit}$  translates to maximum peakto-peak RV:  $\Delta RV_{PP}=2(\pi GM/(2P))^{1/3}$ 



# Multiplicity and Stellar Evolution

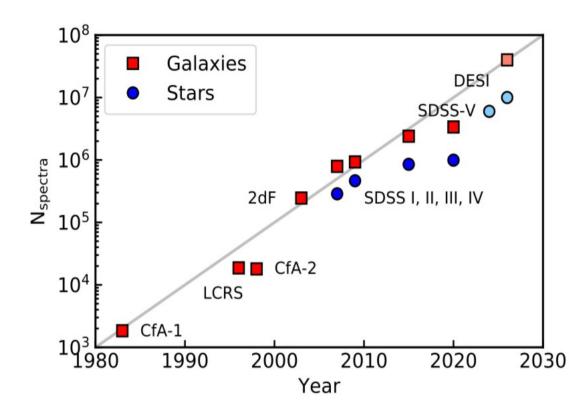




# RVs in Large Spectroscopic Surveys

Carles Badenes SDSSV+ZTF

- **RVs**: most efficient probe of multiplicity for log P<4 ⇒ spectra.
- Large spectroscopic surveys: SDSS/SEGUE [Yanni+ 09], SDSS/APOGEE [Majewski+ 17], RAVE [Steinmetz+ 06], WEAVE [Dalton+ 14], MSE [Szeto+ 18].
- Well characterized
   (pipelines) ⇒ stellar
   parameters.
- Caveat: Orbital fitting requires ~10 RVs, good phase sampling ⇒ not for most targets.



We don't need to fit the orbits to answer many of the open questions about stellar multiplicity!

# RVs in Large Spectroscopic Surveys

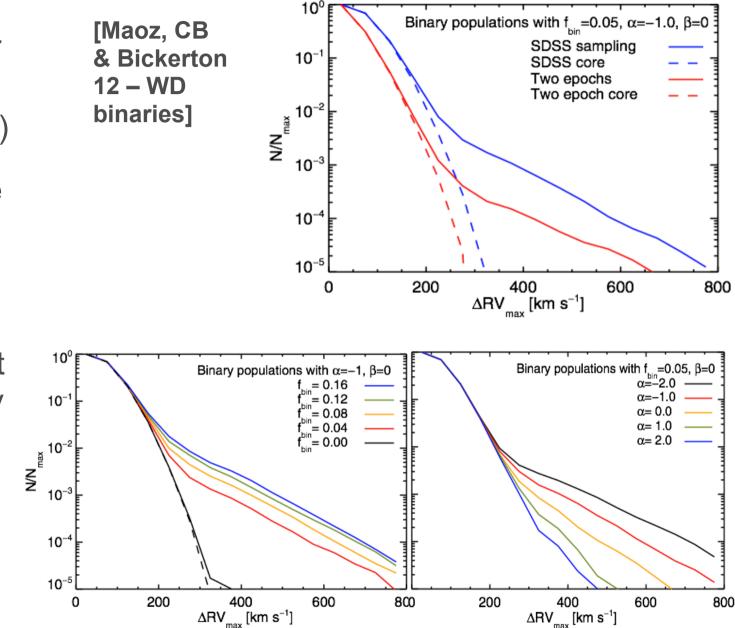
Carles Badenes SDSSV+ZTF

• Few epochs (4 or less)  $\Rightarrow \Delta RV_{max} =$ Max(RV<sub>i</sub>) - Min(RV<sub>i</sub>)

• RV errors  $\Rightarrow$  core of  $\Delta RV_{max}$ distribution. Binaries  $\Rightarrow$  tail.

 Shape and height of tail ⇒ multiplicity statistics.

 Searches for RV variability ⇒ clear transition between core and tail.



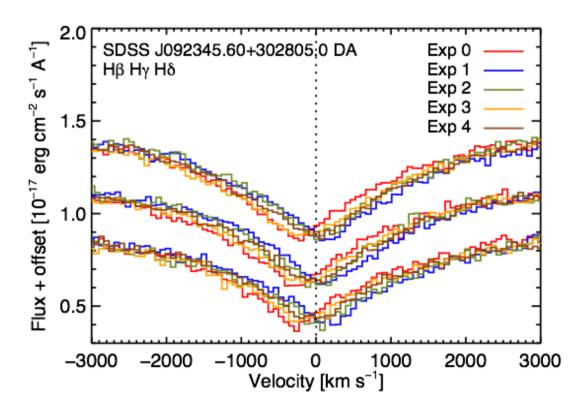
# Pre-merger WDs ⇒ P~hrs, RV~500 km/s, detectable at SDSS resolution (70 km/s/pixel) [Badenes+ 09, Mullally+ 09].

• ~4000 WDs in DR7  $\Rightarrow$  $\Delta RV_{max}$  distribution  $\Rightarrow f_{bin}$ ,  $f(P) \Rightarrow$  WD merger rate.

 Complement w/ SPY survey (fewer WDs, higher R) [Maoz & Hallakoun 17].

• Enough WD mergers to explain SN Ia [Badenes & Maoz 12, Maoz+ 18]. LISA foreground!

#### WD binary 'caught' by SDSS [Badenes+ 09]

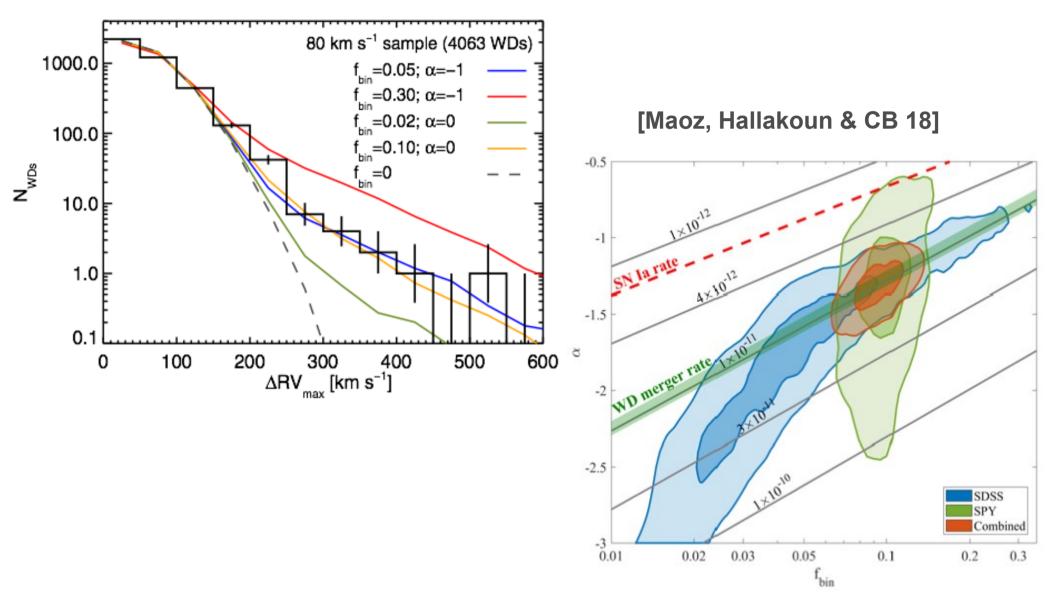


Carles Badenes SDSSV+ZTF

# **WD** Binaries

## **WD** Binaries



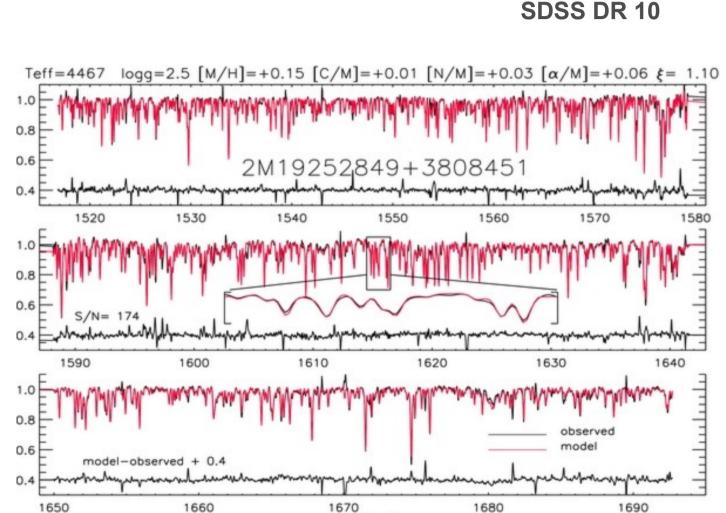


#### Carles Badenes SDSSV+ZTF

 Galactic evolution: Multi-epoch IR spectra R~20,000, ~10<sup>5</sup> stars, high S/N [Majewski+ 17].

• MS, RG and RC stars, M~1 M<sub>Sun</sub>, most of MW disk [Zasowski+ 13].

 ASPCAP [Perez+ 16] ⇒ T<sub>eff</sub>, log(g),
 [Fe/H], RVs. RC catalog [Bovy+ 14].
 The Cannon [Ness+ 15,16].



λ (nm)

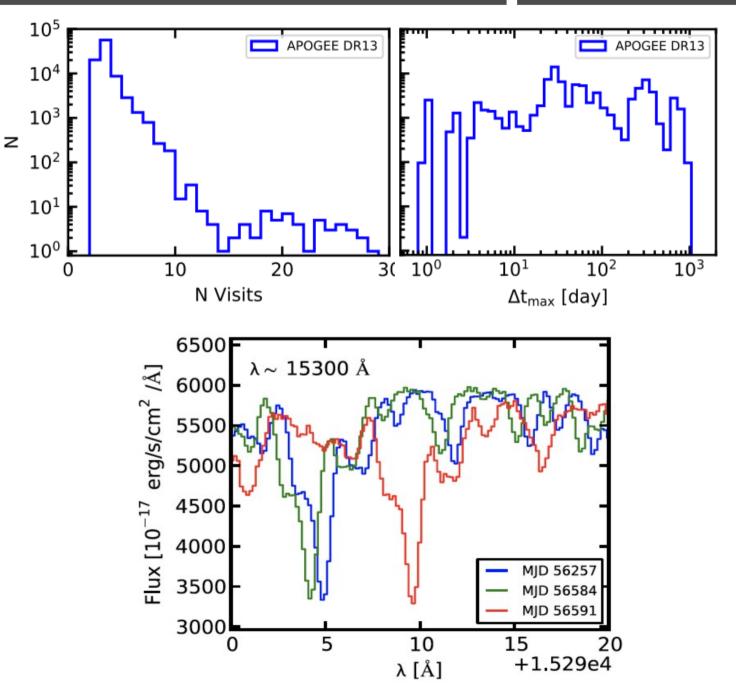
# APOGEE

Carles Badenes SDSSV+ZTF

Few RVs/star
 (median is 3) ⇒
 no orbits! [but
 Troup+ 16]

• Figure of merit:  $\Delta RV_{max}$ . Multiple systems  $\Rightarrow$   $\Delta RV_{max} > 10$  km/s (> 2,000).

 Clear trend of ΔRV<sub>max</sub> with log(g): stellar multiplicity meets stellar evolution.

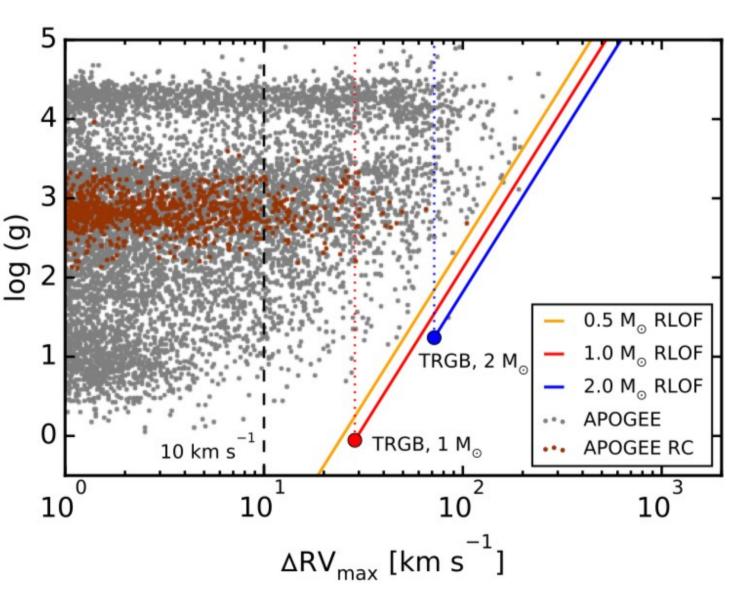


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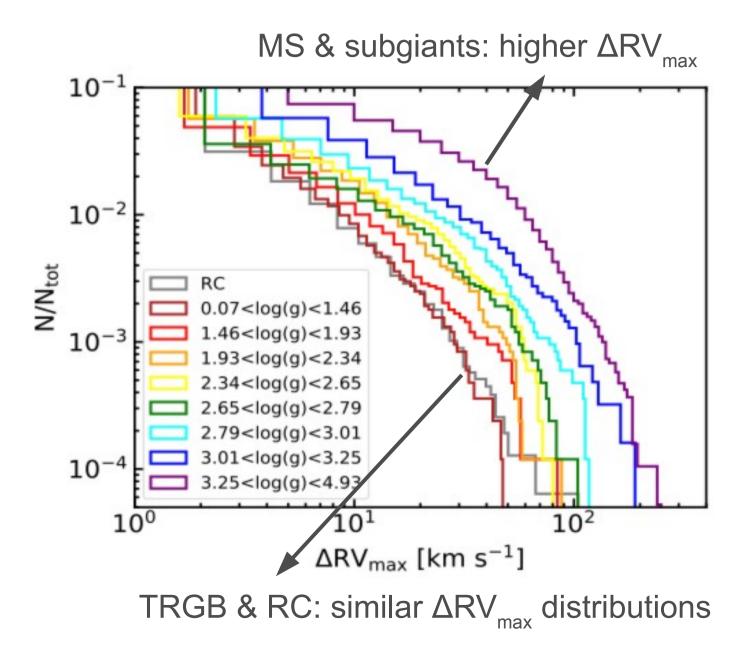
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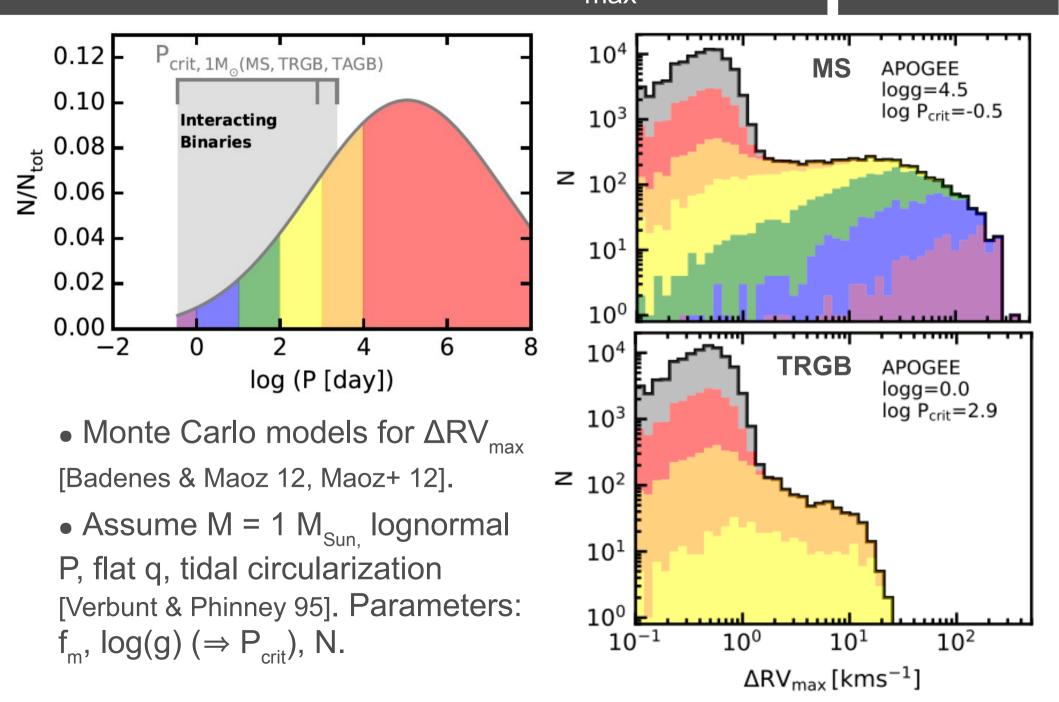
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 Clear trend of ΔRV<sub>max</sub> with log(g): stellar multiplicity meets stellar evolution.



# APOGEE: Models for $\Delta RV_{max}$



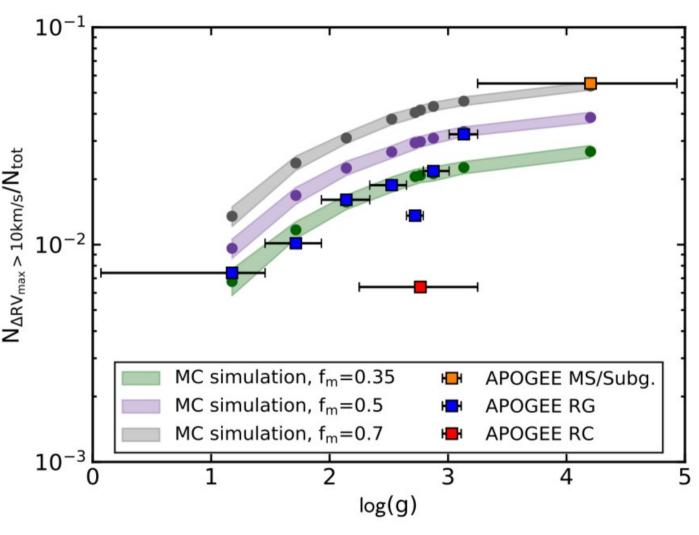
#### Carles Badenes SDSSV+ZTF

Fraction of systems with ΔRV<sub>max</sub>
 > 10 km/s.

• MC models work well in the RGB, but not at high log(g).

# Support for lognormal P dist, truncated at P<sub>crit</sub>.

• Best-fit MC model in the RGB has f<sub>m</sub>=0.35. Caveats: log P < 3.3, simple models, WD+RGB [MD 17].



# APOGEE: ΔRV<sub>max</sub> vs. [Fe/H]

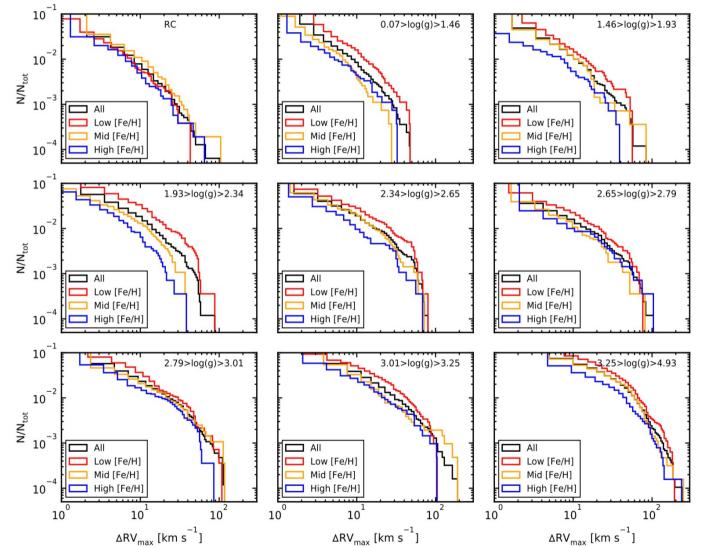
#### Carles Badenes NYU 4/16/19

• APOGEE view of MW disk  $\Rightarrow$  [Fe/H].

•  $\Delta RV_{max}$  distribution in [Fe/H] terciles: low ~ -0.5; high ~0.0.

ΔRV<sub>max</sub> in low
 [Fe/H] clearly above
 high [Fe/H] in all
 non-RC samples.

Consistent with f<sub>m</sub>
 a factor 2-3 higher
 at low [Fe/H] for
 close (log P < 3.3)</li>
 binaries.

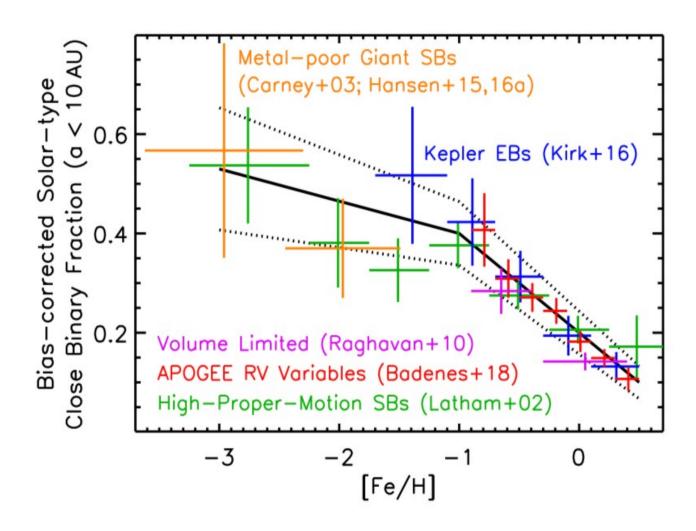


# APOGEE: $\Delta RV_{max}$ vs. [Fe/H]

• Previous RV surveys did not find this effect!!!!

Moe, Kratter & CB
18: explained by uncorrected biases.

• Bias-corrected meta-analysis: consistent picture: f<sub>m</sub> increase by a factor 6 across [Fe/H] range.

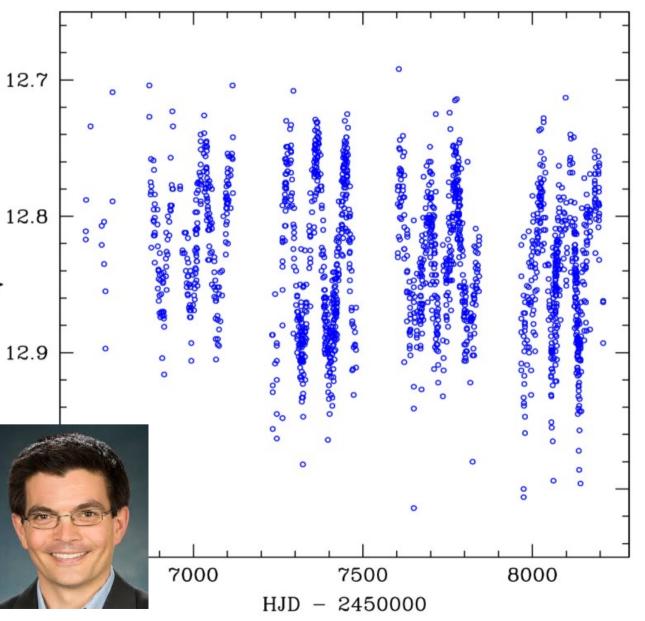


Moe, Kratter & CB 18

Carles Badenes SDSSV+ZTF

• Use APOGEE RVs to select systems with high mass function.

- TAT-1: photometric variable, P=83 days. Starspots. K = 45 km/s SB1.
- GAIA parallax: D>2.5 kpc, L>200  $L_{sun} \Rightarrow M_1 > 2 M_{sun} \Rightarrow M_2 > 2.5 M_{sun}$ .
- Probably a BH!

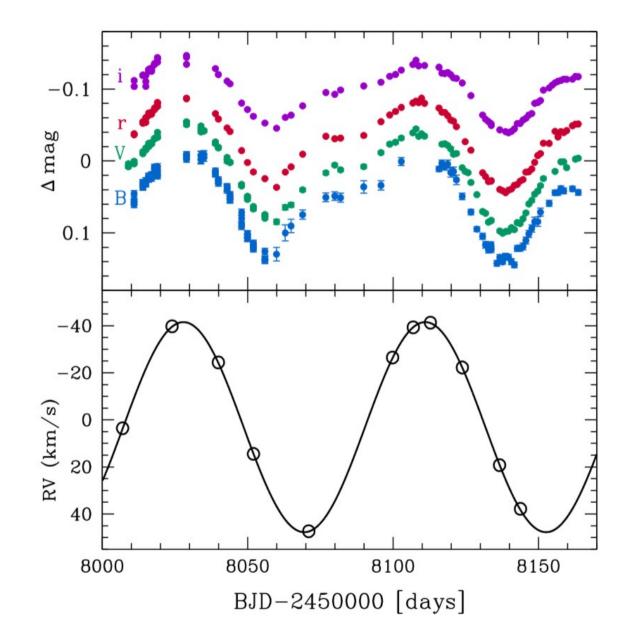


Thompson+ 19

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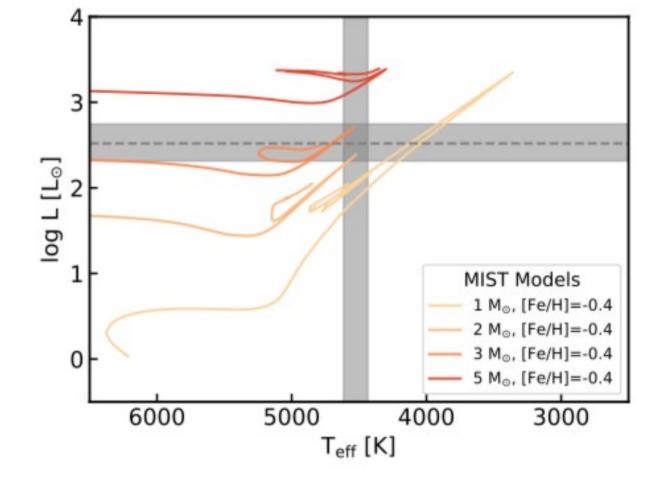


Thompson+ 19

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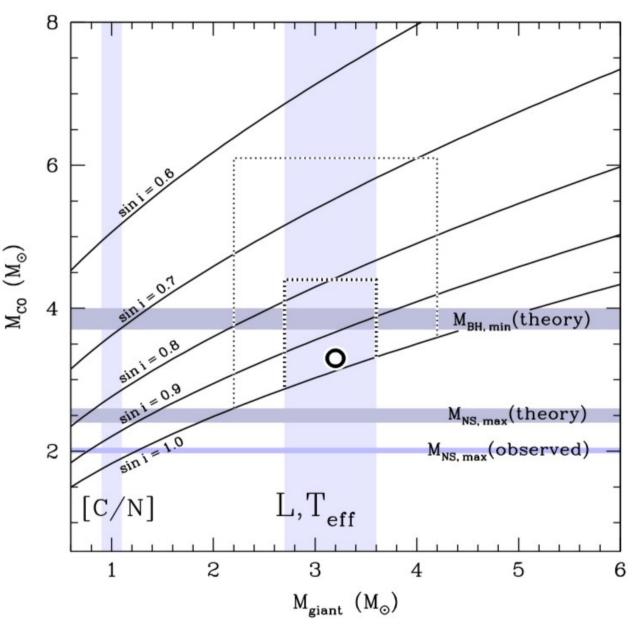


#### • Probably a BH!

#### Carles Badenes SDSSV+ZTF

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Thompson+ 19

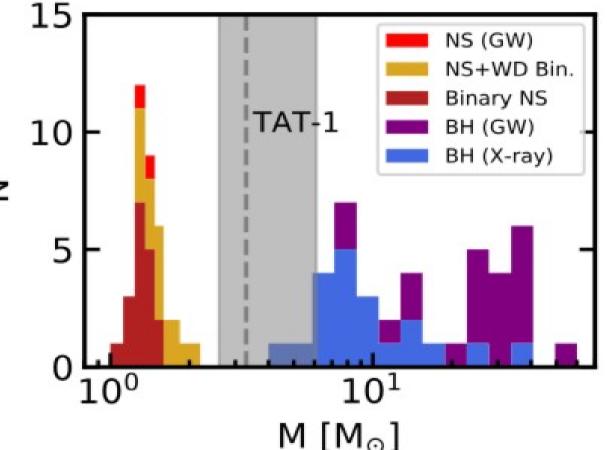
Probably a BH!

#### Thompson+ 19

Discovery of TAT-1

- Use APOGEE RVs to select systems with high mass function.
- TAT-1: photometric variable, P=83 days. Starspots. K = 45 km/s SB1.

• GAIA parallax: D>2.5 kpc, L>200  $L_{Sun} \Rightarrow M_1 > 2 M_{Sun} \Rightarrow$  $M_{2} > 2.5 M_{Sun}$ .



# Implications

Case B mass transfer rate ⇒
 CE events, stellar mergers
 (LRNe), birth rate of short P
 systems? [Tylenda+ 13,
 Kochanek+ 14].

- More close binaries at low
  [Fe/H] ⇔ SF theory [Machida+
  09, Bate 14].
- What about BPS models in different environments, redshift evolution? [de Mink & Belczynski 15]?
- Planet host metallicities ⇒
   habitability [Johnson 10, Howard+
   12, Thompson+ 17, Guo+ 17].

#### 10 11 12 (magnitude) 13 14 **V838 Mon** 15 16 17 2000 2500 3000 4000 4500 5000 3500 5500 JD 2450000+

#### V1309 Sco [Tylenda+ 13]

# Implications

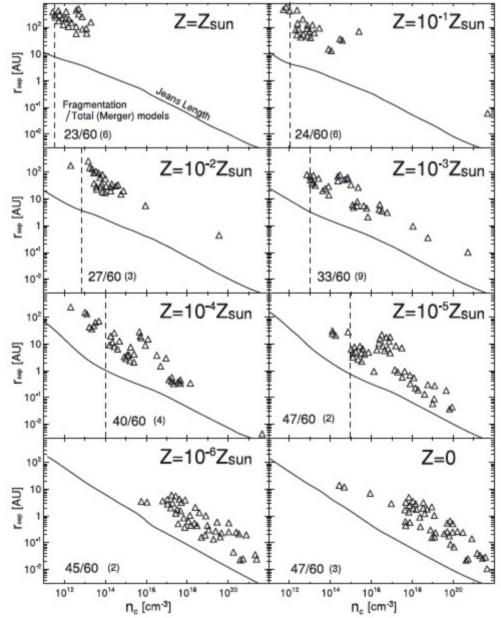
#### Carles Badenes SDSSV+ZTF

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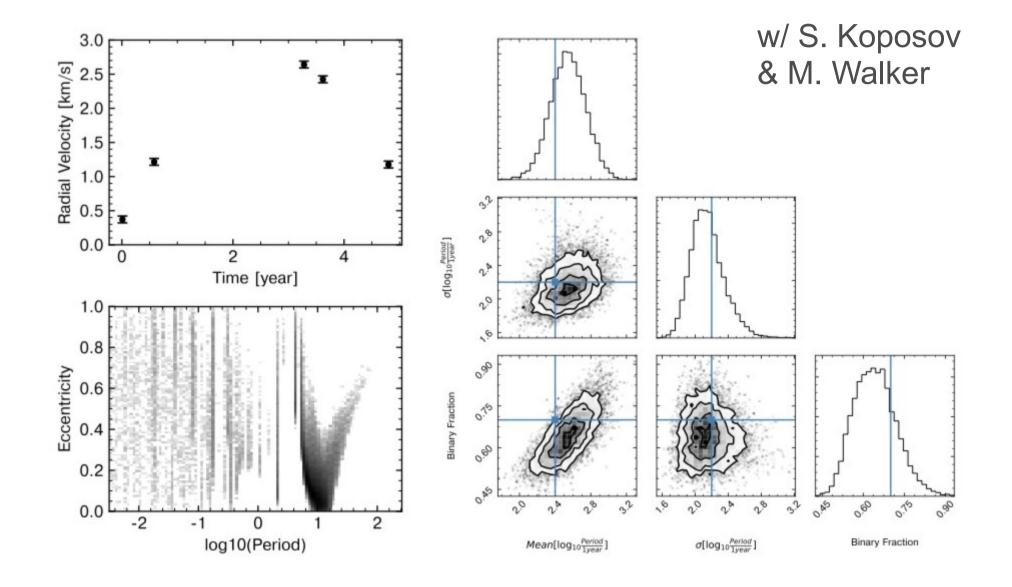


#### Machida+ 09

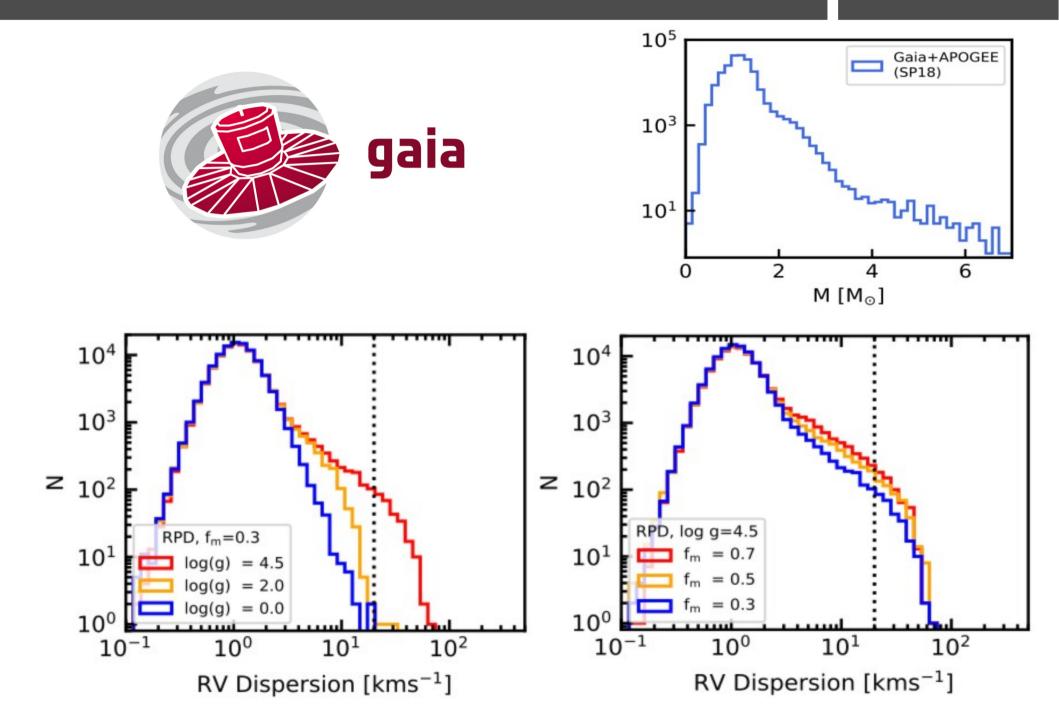
# Summary

- APOGEE: high resolution, multi-epoch IR spectra of ~100,000 stars (Galactic archeology).
- Unique view of stellar multiplicity in the field, from the MS to the RC. Few-epoch spectra: no orbits  $\Rightarrow \Delta RV_{max}$ .
- Attrition of high  $\Delta RV_{max}$  (short P) systems as stars climb the RGB, consistent with lognormal P dist., truncated at P<sub>crit</sub>  $\Rightarrow$  Case B mass transfer.  $\Delta RV_{max}$  in RC stars ~ TRGB.
- Clear trend with [Fe/H]: lower [Fe/H] stars have higher  $\Delta RV_{max}$  distributions  $\Rightarrow$  higher f<sub>m</sub> at lower [Fe/H].
- Discovery of the first stellar mass non-accretting BH.
- Future work: Hierarchical Bayesian models, multiplicity statistics w/ age & Galactic location, GAIA, BPS, follow-up of interesting systems.

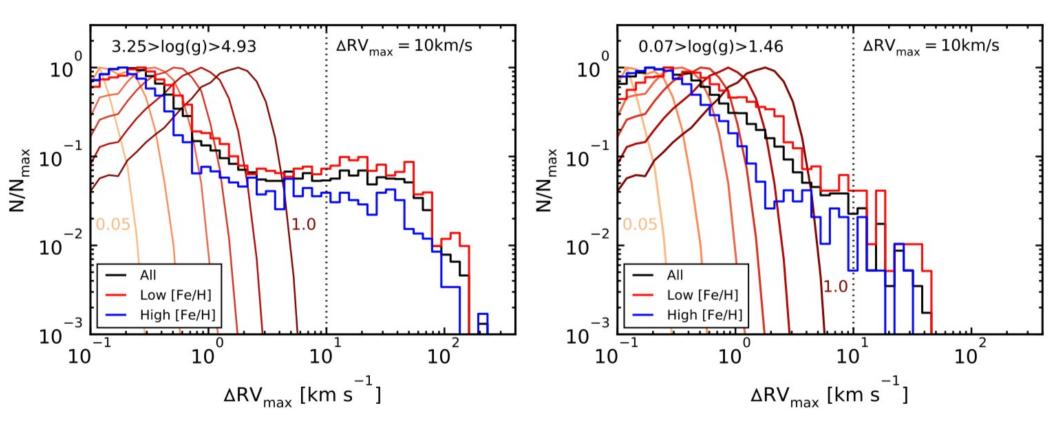
# **Hierarchical Bayesian Models**



GAIA



## Additional Plots



Finding interesting (accelerated and otherwise) binaries from Gaia SDSS-V/ZTF

Timothy Brandt Assistant Professor University of California, Santa Barbara with Trent Dupuy, Jackie Faherty, Brendan Bowler, G. Mirek Brandt, Daniel Michalik, Yiting Li, Daniella Bardalez-Gagliuffi, Mark Popinchalk

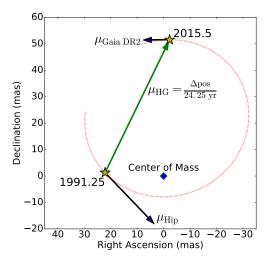
April 18, 2019

#### Part I: Astrometric Accelerators

Need detectable acceleration, single-star astrometry

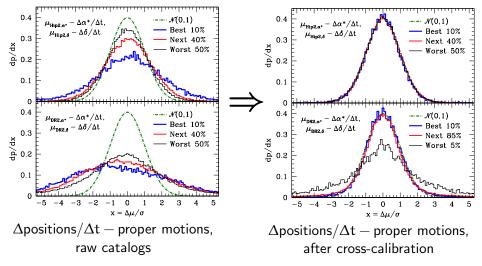
- ${\scriptstyle \bullet}$  Separations  $\sim 2-100~{\rm AU}$
- Large brightness difference
- ${\scriptstyle \bullet}$  Nearby:  $d \lesssim 200~{\rm pc}$

Basic idea: Hipparcos and Gaia can detect astrometric accelerations of a few  $\mu as/yr^2$ , a few m/s/yr at 50 pc. Gaia DR3 will improve this (ideal case:  $\sigma_{\mu} \sim t^{-3/2}$ ).



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#### Use of *Hipparcos* and *Gaia* for fitting orbits & identifying astrometric accelerators requires a *cross-calibration*.



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#### Full details of the cross-calibration are in Brandt (2018): The *Hipparcos-Gaia* Catalog of Accelerations

- Refinement of Hipparcos astrometry with Gaia parallaxes
- Propagation of all positions to their central epochs
- 60/40 linear combination of the two *Hipparcos* reductions outperforms either reduction individually at  $150 \sigma$  significance
- Spatially variable calibration offsets and frame rotations between the catalogs

- Error inflation in quadrature for *Hipparcos*, spatially dependent multiplicative error inflation for *Gaia*
- Perspective acceleration included
- Three proper motions given on the DR2 reference frame

If we also have RV and relative astrometry from imaging, we can fit orbits even for long-period systems:

$$lpha_{
m astrometric} = rac{GM_2}{r_{12}^2}\cos arphi$$
 $lpha_{
m RV} = rac{GM_2}{r_{12}^2}\sin arphi$ 

$$\rho_{\text{projected}} = r_{12} \cos \phi$$

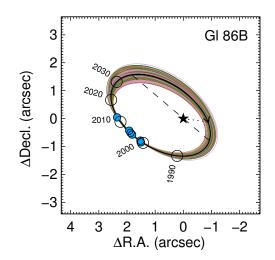
combine to determine the companion mass (though full orbital fits generally remain necessary).

#### Example: white dwarf companion to GI 86

$$\begin{array}{ll} \mbox{Proper Motion Difference} & \mbox{Significance} \\ \mu_{\alpha*,Hip} - \mu_{\alpha*,H \to G} = -14.98 \pm 0.43 \mbox{ mas yr}^{-1} & \mbox{35}\sigma \\ \mu_{\alpha*,Gaia} - \mu_{\alpha*,H \to G} = -17.80 \pm 0.13 \mbox{ mas yr}^{-1} & \mbox{133}\sigma \\ \mu_{\delta,Hip} - \mu_{\delta,H \to G} = 12.73 \pm 0.46 \mbox{ mas yr}^{-1} & \mbox{27}\sigma \\ \mu_{\delta,Gaia} - \mu_{\delta,H \to G} = -3.53 \pm 0.12 \mbox{ mas yr}^{-1} & \mbox{31}\sigma \end{array}$$

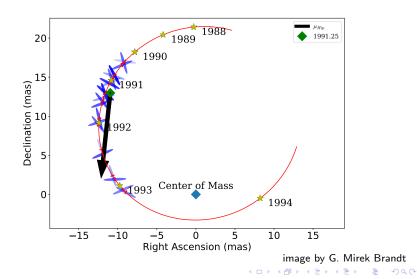
Orbital period is  $\sim$ 70 years, but we have a  $\sim$ 1% measurement of the astrometric acceleration!

RVs from UCLES/AAT, relative astrometry from HST

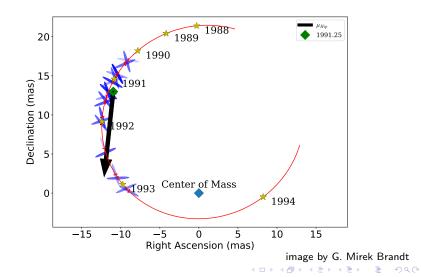


Orbit fit by Trent Dupuy: mass of the white dwarf GI 86B improves from 0.5  $\pm$  0.1 to 0.60  $\pm$  0.01  $M_{\odot}$  (Brandt et al. 2018).

... and we can use the *Hipparcos* and *Gaia* scanning laws to fit individual observations, even without the full epoch astrometry. Very important, especially for DR3.



Note that **DR3 will release accelerations, not orbits!** Fitting orbits to DR3 accelerations with the scanning law (epochs and scan angles) will be the only way to go.



#### Current work

with Trent Dupuy, Brendan Bowler, Jackie Faherty, G. Mirek Brandt, Yiting Li, Daniel Michalik, Daniella Bardalez-Gagliuffi, Mark Popinchalk

- Fitting exoplanet orbits, breaking sin i degeneracy
- Masses and orbits for long period brown dwarfs, low-mass stars, white dwarfs
- Searches for new companions, targets for RV and imaging follow-up

Great way to find and weigh Sirius-like binaries!

Even better for (heavier) non-interacting neutron stars and black holes?

*Gaia* DR3 will measure accelerations for millions of stars, but **confirmation** and **masses** really need RV curves. Whence the RVs?

#### SDSS-V Ideas:

- MARVELS for dark remnants. 100  $\mu as\,yr^{-2}$  at 200 pc is 100 m s^{-1}\,yr^{-1}—not crazy.
- Can we find the nearest neutron star or black hole?
- Chemical compositions of main sequence stars with dark companions?

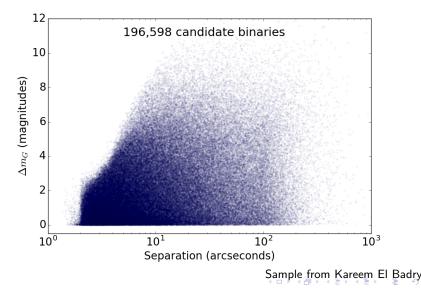
#### ZTF Idea:

 Gyrochonology+masses to constrain pre-mainsequence of low-mass stars, evolution of brown dwarfs and remnants? C.f. Lynne Hillenbrand's talk.

#### Part II: Non-Accelerating Binaries

- ${\scriptstyle \bullet}$  Wide: separations  $\gtrsim 20$  AU
- ${\scriptstyle \bullet}$  More distant: up to at least  ${\sim}500~{pc}$
- Favors stars of comparable brightness
- Major credit to Kareem El-Badry!

#### ${\sim}200,000$ systems within 500 pc have compatible parallaxes and proper motions. Most are binaries.

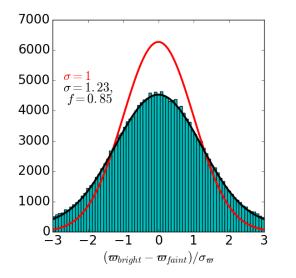


So much about the distribution of stellar binaries is hidden in that sample!

- Mass ratio distribution
- Semimajor axis distribution
- Eccentricity distribution (isothermal???)
- Trends with age, metallicity?
- Hierarchical triples??

We can have it all ... once we deal with *Gaia* systematics and underestimated uncertainties, and the *Gaia* selection function.

#### Example: DR2 parallax errors underestimated by 20-30%?



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Really want more data—like RVs—to model orbits and back out *Gaia* systematics. Recall 100  $\mu$ as/yr at 200 pc is ~100 m/s.

#### **SDSS-V** to the rescue?

 $\sim$ 200,000 binaries would also be great for understanding scatter in gyrochronology.

Typical brightness of  $G\sim 14\mbox{ mag}$  is well-matched to the ZTF saturation limit.

Back to the title (my perspective):

- Interesting individually: the accelerators
- Interesting statistically: the wide binaries

A philosophical comment on "rare and/or interesting systems:" searching for **outliers** in a large survey like *Gaia* will inevitably uncover **pathologies** in the data.

Independent supporting measurements are vital!

- RVs and chemistry from SDSS-V!
- Light curves from ZTF!

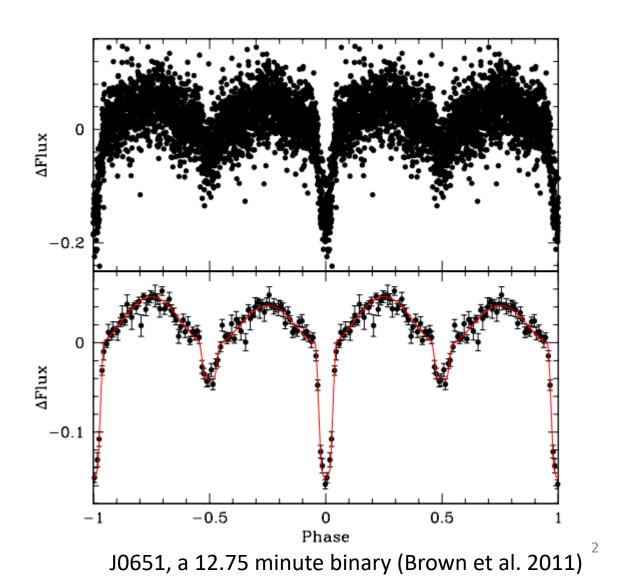
# Status Report on Search for Double Degenerates with ZTF

Kevin Burdge

California Institute of Technology

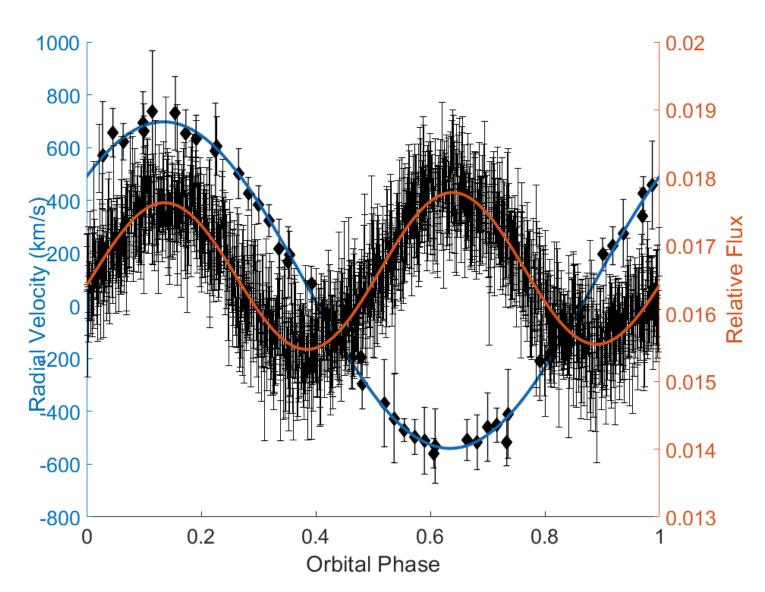
### How do we find White Dwarf Binaries

- Eclipses
- Ellipsoidal modulation
- Irradiation of companion



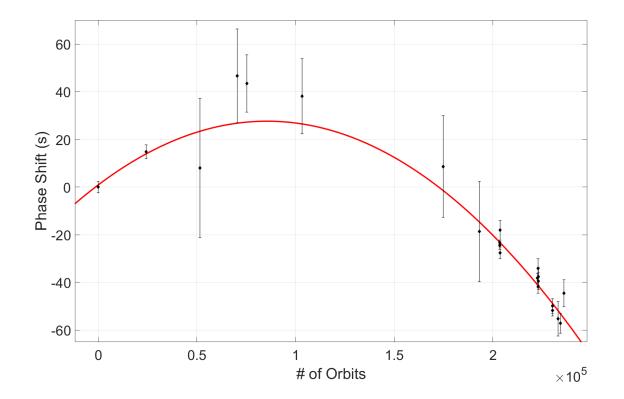
# Before ZTF

- Discovered one double degenerate in PTF
- The system exhibits a 20 minute orbital period, ellipsoidal modulation, Doppler boosting, and significant orbital decay



# **Orbital Decay**

- After waiting 1.5 years, we have measured, with significance, the orbital decay of this system.
- The inferred chirp mass is rather large (~0.4 solar masses), indicating that this is likely a loud LISA source given its parallax measurement.



# Technical Challenges and Solutions

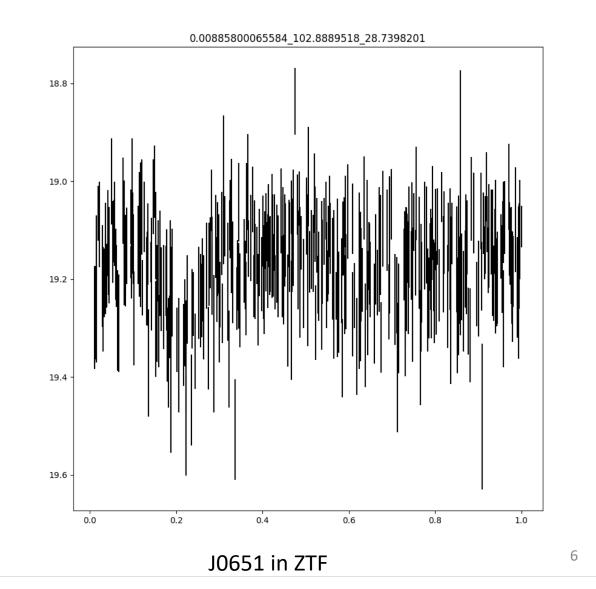
- Searching for short periods in long baseline data is computationally expensive
- Graphics Processing Units (GPUs) can largely outperform CPUs in such searches
- For the shortest orbital period systems, we must account for orbital period decay



Nvidia 1080 Ti GPU (image from Nvidia.com)

### Our Test Run with ZTF

- On the right, is a ZTF commissioning lightcurve of J0651, the 12.75 minute binary
- The primary eclipse is clearly visible

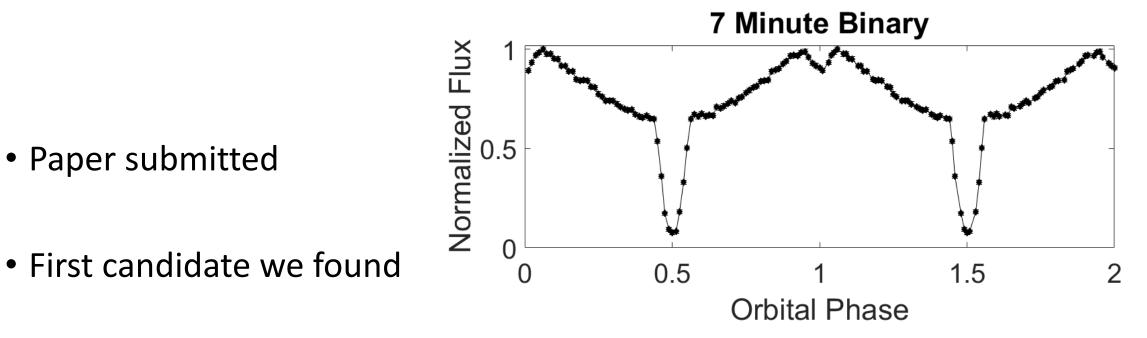


### ZTF Science Results

- There are 6 published eclipsing detached DWDs
- So far with ZTF, we have discovered 5 new eclipsing systems (with a possible 6<sup>th</sup> candidate)
- In the remainder of this talk, we will highlight them

## The 7 Minute Binary

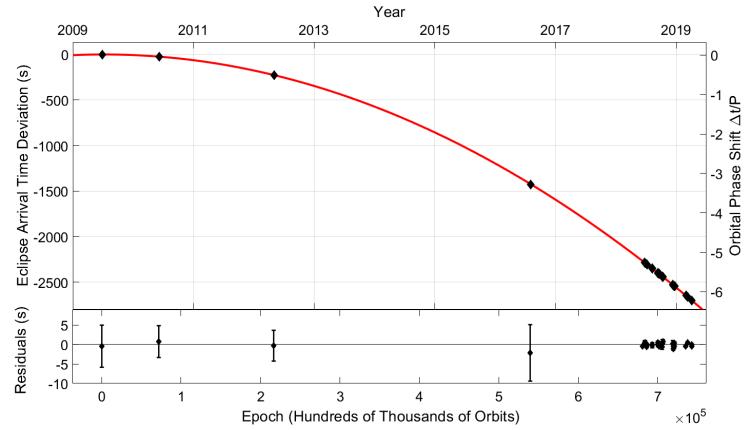
Paper submitted



• Exhibits strong reflection effect and eclipses

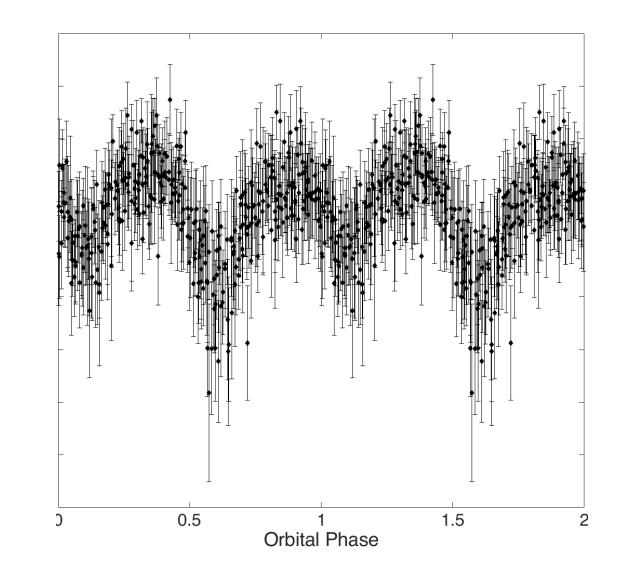
### Orbital Decay Measurement on the 7-minute

• Using archival PTF data, we managed to make a highly precise measurement of the orbital decay due to GR in this system



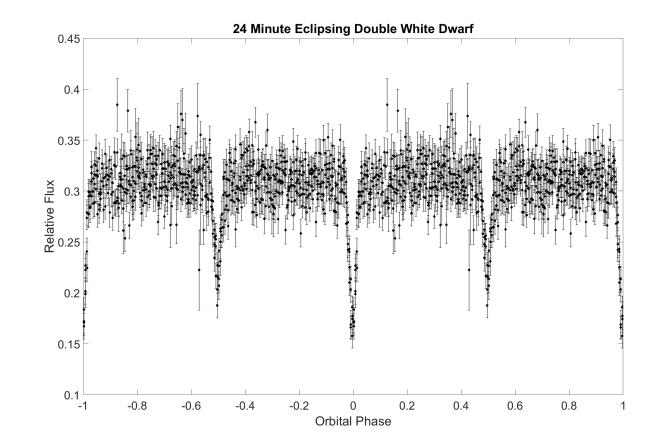
### A new candidate at ~8 minutes

- Appears likely to be a binary candidate based on position on HR diagram.
- More follow up still needed. If real, would be highest SNR LISA source known (has a reasonably good parallax measurement)



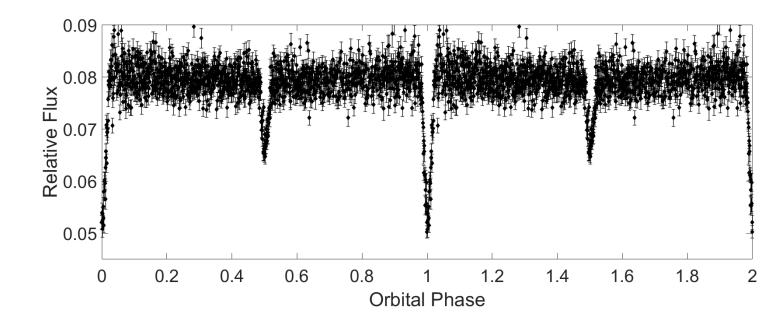
# 24 Minute Eclipsing System

- Eclipses are comparable depth, indicating that the two components contribute comparable luminosity
- Appears to be double lines from spectrum, but will be very challenging to fit due to two blended broad absorption lines
- Estimated LISA signal quite marginal

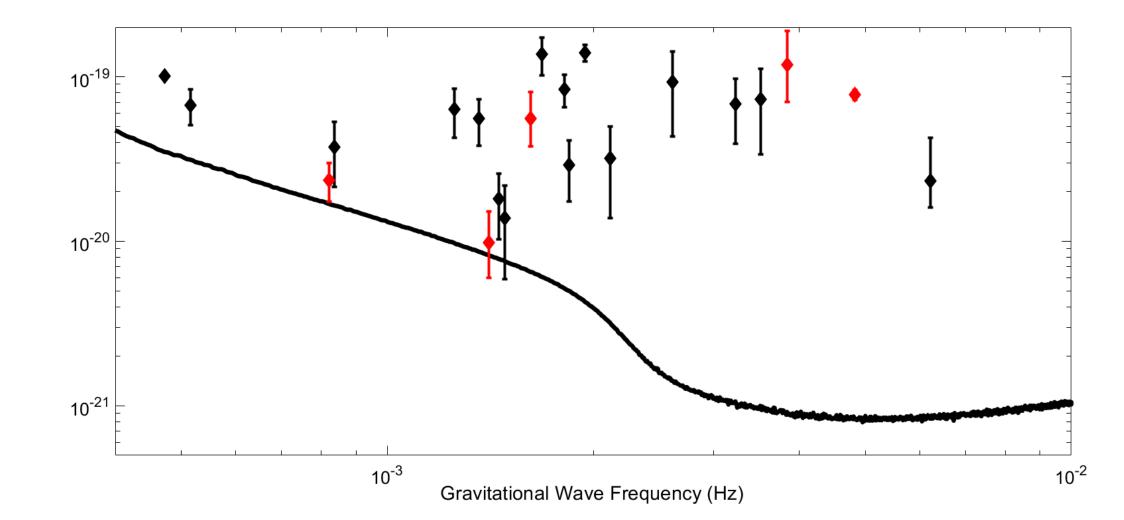


# 40 Minute Eclipsing System

- Again, eclipses appear to be comparable in depth, suggesting comparable luminosity contribution
- No spectrum yet.
- Likely to have a marginal LISA signal



### Where do these fall as LISA sources?



## The future: SDSS V and Beyond

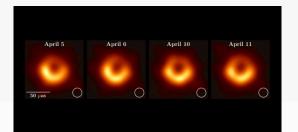
- Spectroscopic follow up of these systems is challenging. The 24 minute for example, because of its double lined nature, does not appear to have significant Doppler shifts, but rather seems to change in log(g) and Teff as the Balmer lines "widen" and "narrow". This could perhaps be used to target such systems.
- Systems like the 20 minute binary, which are single lined, exhibit enormous radial velocity variations (620 km/s semiamplitude in the case of this example). Even for low resolution surveys, this should be easy to resolve. However, exposures must be short.



Stellar/AGN photometric astronomy in the era of SDSS Phase V Carnegie, May 3<sup>rd</sup> 2019

# AGN: the most powerful variable sources in the Universe

Matthew J. Graham ZTF Project Scientist mjg@caltech.edu

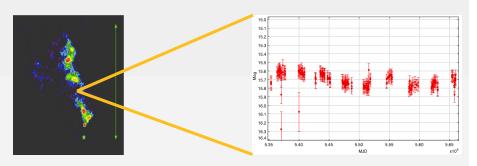


(EHT Collaboration)

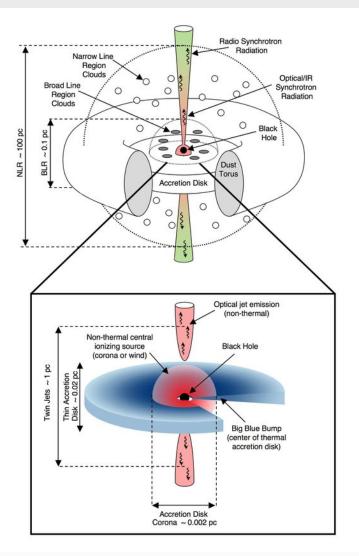


#### Quasar variability

 First quasar identified 3C 48 – most striking feature was that the optical radiation varied



- Physical origin of photometric variability in optical/UV is unclear:
  - Instabilities in the accretion disk
  - Supernovae
  - Microlensing
  - Stellar collisions
  - Thermal fluctuations from magnetic turbulence





### Physical timescales in AGN

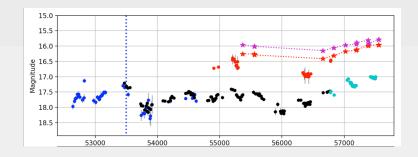
Viscous ("radial drift")10,000 yr-Light travelHoursDaysDynamicalDaysYearsThermalDays-years-	Viscous ("radial drift")		
DynamicalDaysYearsThermalDays-years-		10,000 yr	-
Thermal Days-years -	Light travel	Hours	Days
	Dynamical	Days	Years
	Thermal	Days-years	-



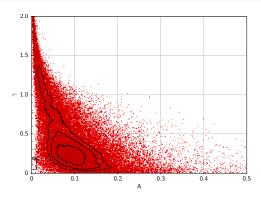
(C. MacLeod)

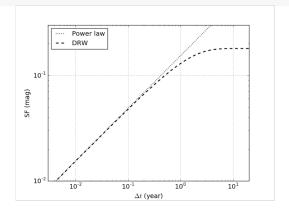
### Describing quasar photometric variability

- $|\Delta m| > x$ 
  - DPOSS vs. SDSS (Stripe 82) vs. PS1
- Excess variability:  $\chi^2$
- Structure function



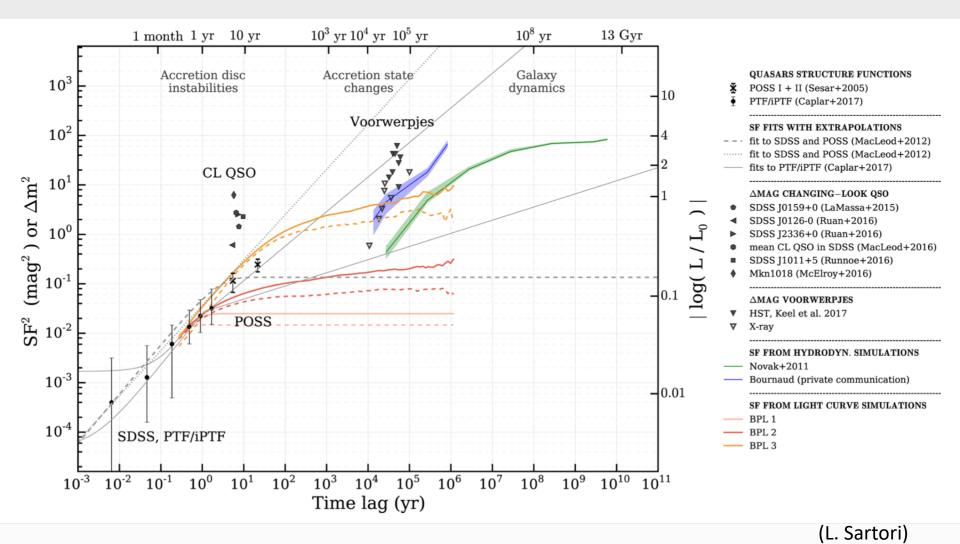
- Variability amplitude as a function of the time lag between compared observations
- Historic descriptor of variability and a variety of estimators
- Not much information







#### Variability timescales

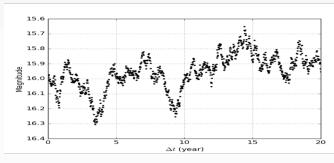


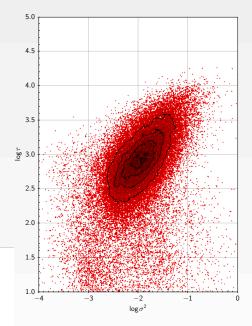


### Damped random walk (DRW/OU)

$$dX(t) = -\frac{1}{\tau}X(t)dt + \sigma\sqrt{dt}\varepsilon(t) + bdt \quad \tau,\sigma,t > 0$$

- Characterized by variability amplitude  $\sigma$  and timescale  $\tau$
- Basis for stochastic models of variability
- Deviations noted (e.g., Mushotzky 2011, Zu et al. 2013, Graham et al. 2014)
- Degenerate model can be best fit for a non-DRW process (Kozlowski 2016)
- Need a baseline  $\gtrsim 10\tau$  to recover  $\tau$

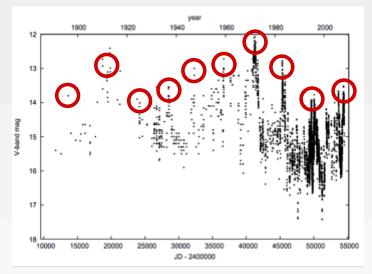


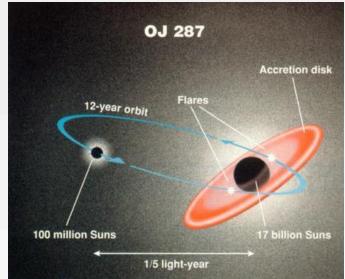


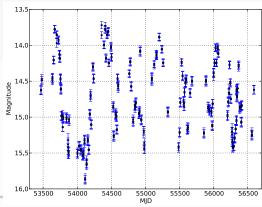


### Are there periodic quasars?

 OJ 287 shows a pair of outburst peaks every 12.2 years for at least the last century





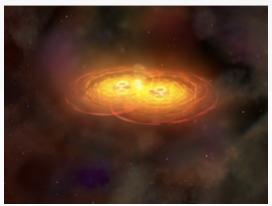




## The physics of a SMBH binary merger

### Stage I (> 1pc)

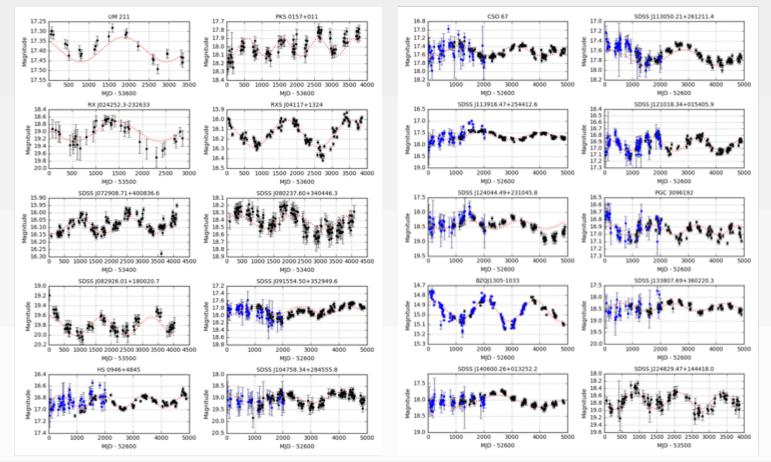
- SMBHs dissipate angular momentum through dynamical friction with surrounding stars
- <u>Stage II (0.01 1pc)</u>
- Stalled phase due to stellar depletion (~10<sup>6</sup> 10<sup>7</sup> yrs)
   <u>Stage III ( < 0.01pc)</u>
- Orbital angular momentum lost by gravitational radiation
   <u>Stage IV</u>
- Coalescence and recoil
- The "final parsec" problem
- Subparsec systems are not resolvable
- PTA and potential LISA sources



8



• Graham et al. (2015a, b) identified 111 quasars with statistically significant periodicity (over stochastic models)



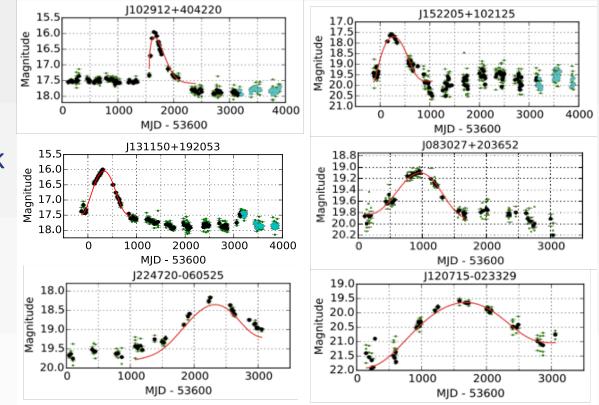
(Updated data Graham et al., in prep)



### Major flares

A sample of 51 AGN with a significant flaring event inconsistent with DRW behavior

- Microlensing
- SLSN-II
- Slow TDEs
- SMBH merger in disk

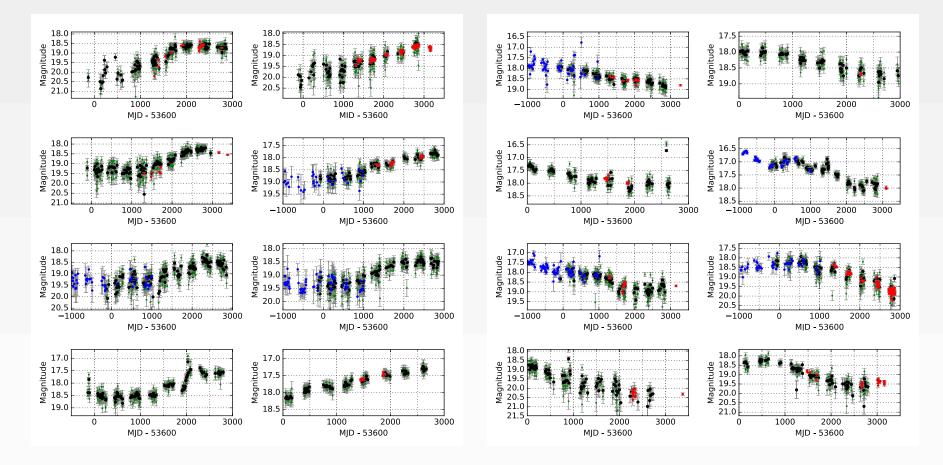


#### (Graham et al. 2017)



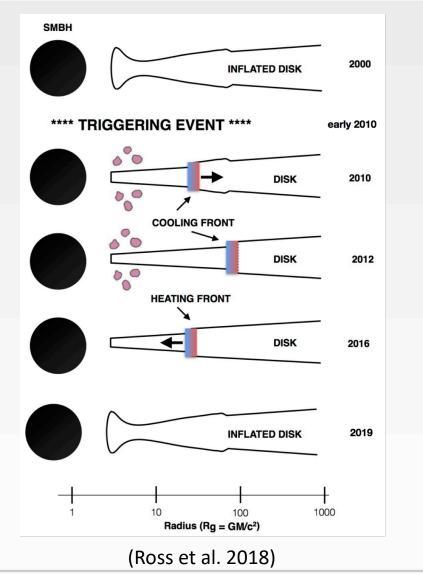
## Changing look/state quasars

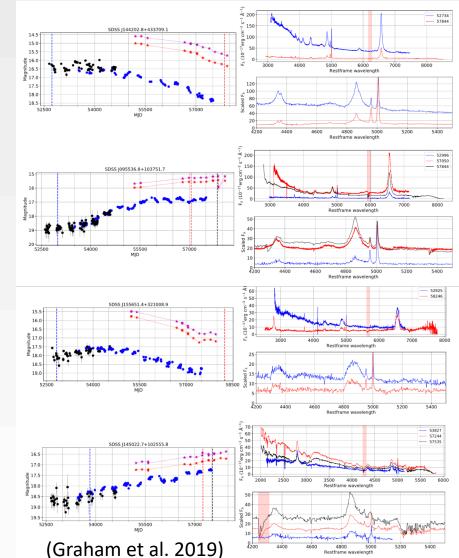
 Characterized by a smooth slow photometric rise/decline of ~1 mag over several years and some degree of spectral variability





### Propagating fronts as an explanation

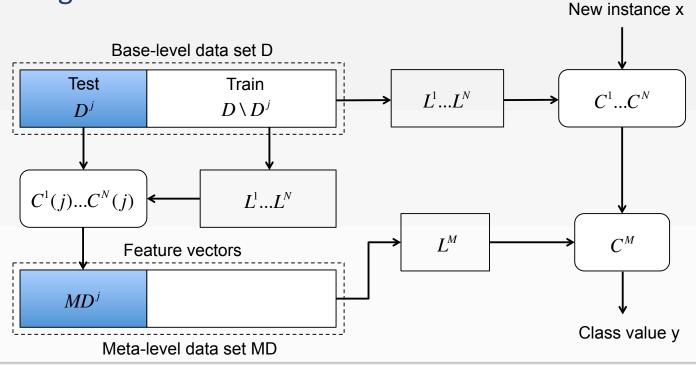






### Variability, color, and zero motion-selected catalogs

- Feature set:
  - Variability characterizations
  - WISE colors (W1, W2, W1 W2)
  - GAIA proper motions
- Stacking framework for ensemble classification







Stellar/AGN photometric astronomy in the era of SDSS Phase V Carnegie, May 3<sup>rd</sup> 2019

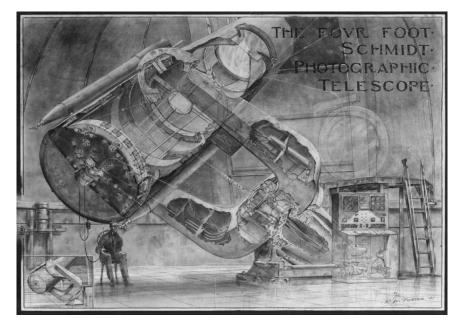
# ZTF as a public survey

Matthew J. Graham ZTF Project Scientist mjg@caltech.edu





### The Palomar legacy



	Dates	Sky	Bands	Depth
POSS-I	1949-1956	Dec > -33	103a-O, 103a-E	22.0 (B)
POSS-II (DPOSS)	1985-1995	Dec > -22	IIIaJ, IIIaF, IVN	22.5-19.5
Palomar-Quest	2002-2009	Dec > -25	BVRI, griz	21 (V)
PTF	2009-2012		gr	20.5
iPTF	2013-2015	Dec > -30	gr	20.5
ZTF-I	2018-2020	Dec > -30	gri	20.5 (r)





















### The current landscape of sky surveys

	ATLAS	ASAS-SN	Pan-STARRS	ZTF	LSST
Total sources	-	10 <sup>8</sup>	10 <sup>10</sup>	10 <sup>9</sup>	37 x 10 <sup>9</sup>
Total detections	10 <sup>12</sup>	1011	1011	10 <sup>12</sup>	37 x 10 <sup>12</sup>
Annual visits/source	1000	180	60	3000	100
No. of filters	2	2	5	3	5
No. of pixels	10 <sup>8</sup>	$4 \times 10^{6} (x 4)$	10 <sup>9</sup>	6 x 10 <sup>8</sup>	3.2 x 10 <sup>9</sup>
CCD surface area (cm <sup>2</sup> )	90	9	1415	1320	3200
Field of view (deg <sup>2</sup> )	30	4.5	7	47	9
Hourly survey rate (deg <sup>2</sup> )	3000	960	-	3760	1000
$5\sigma$ detection limit in r	19.3	17.3	21.5	20.5	24.7
Nightly alert rate	-	-	-	10 <sup>6</sup>	10 <sup>7</sup>
Nightly data rate (TB)	0.15	-	-	1.4	15
Telescope (m)	0.5	4 x 0.14	1.8	1.2	6.5
No. of telescopes	2 (6)	5	2	1	1













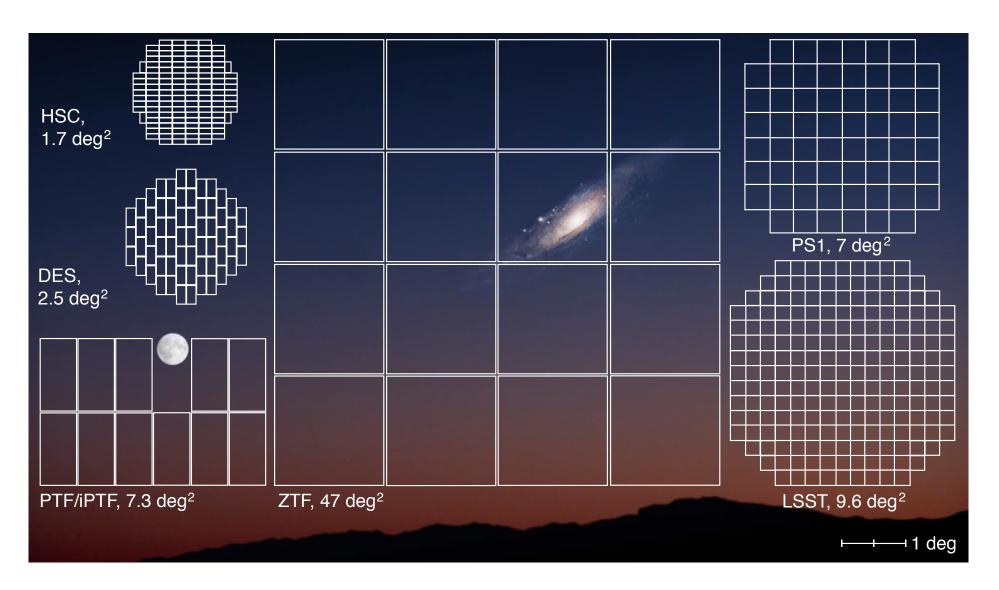






### **Relative coverages**







## The public face of ZTF

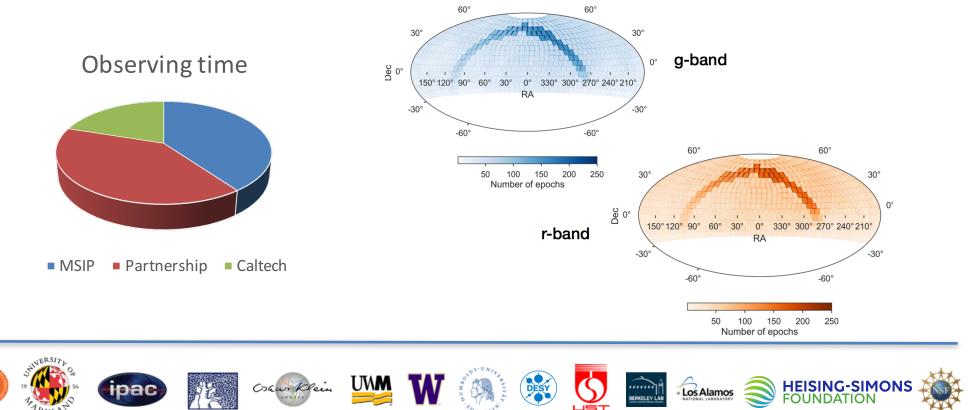


#### Northern Sky Survey

- Two visits/night (g+r) for asteroid rejection => 3-day average
- 23,675 deg<sup>2</sup> total footprint; 85% time; 4325 deg<sup>2</sup> average/night

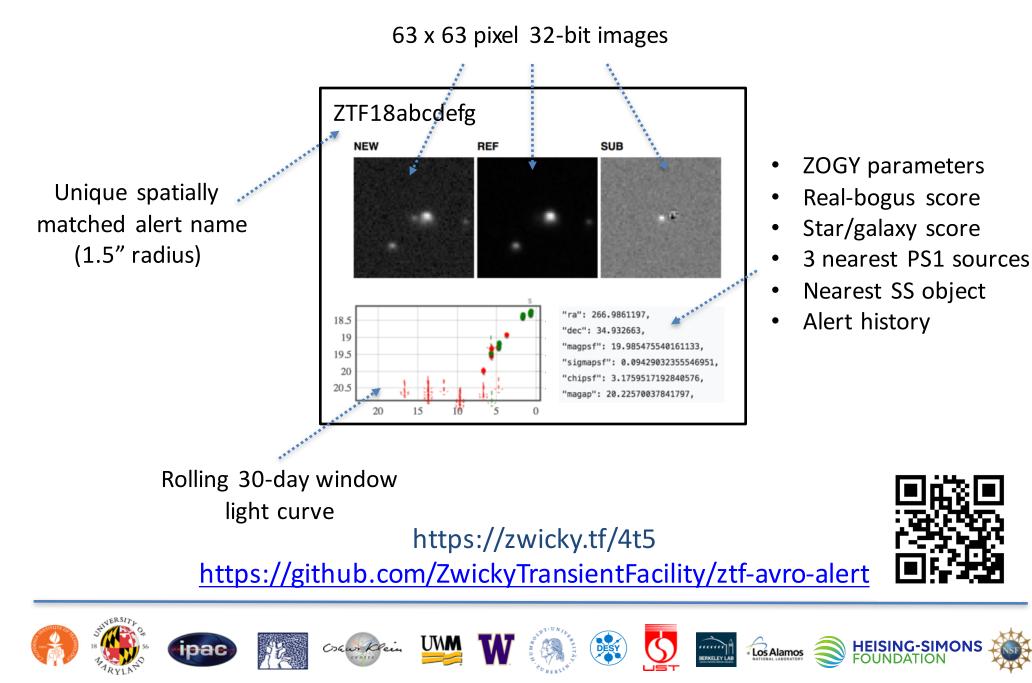
#### **Galactic Plane Survey**

- Nightly sweep of the Galactic Plane (|b|<7; nightly g+r)</li>
- ~2,800 deg<sup>2</sup> total footprint; 15% time; 1475 deg<sup>2</sup> average/night



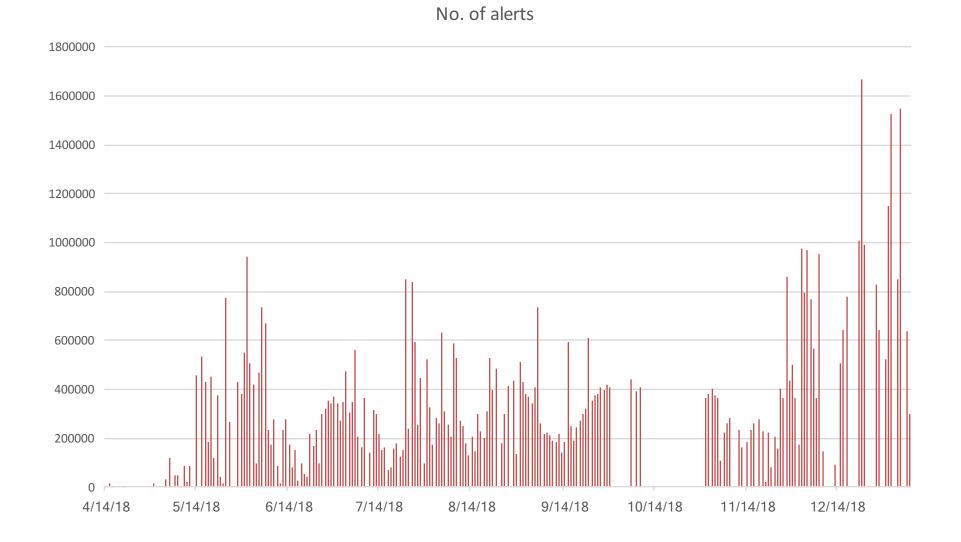


### Alert structure: AVRO format





### Alert statistics: 89,721,932 to 3/11/19



 $(\mathbf{A}) = (\mathbf{A}) = ($ 



### Where can I get alerts?

Service	Basic web search	User- defined filters	Notifications	Kafka streams	ΑΡΙ	Bulk access
LCO MARS	Yes	No	-	No	JSON	No
ANTARES	No	Python	Slack	Yes	Python	(Yes)
LASAIR	Yes	SQL	-	No		No
UW	No	No	-	No	No	Yes
ALERCE	Coming soon					







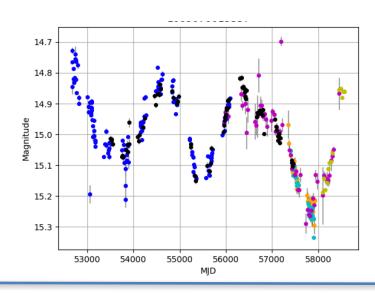




### The greater public legacy of ZTF



	Dates active	Magnitude limit	Mean $\Delta t$	Data available
LINEAR	1998-2007	18	22 d	Yes
CRTS	2003-2016	19.0-21.5	10 d	Yes
PTF/iPTF	2009-2015	20.5	77 d	Yes
ASAS-SN	2013-	18	1d	On demand
ATLAS	2016-	19	2d	No
ZTF	2018-	20.5	3 d	Yes





## Why decadal baselines are important



- Quasars have a characteristic restframe variability timescale  $\tau$  of 100s of days which scales with black hole mass
- Light curves need to cover at least  $10\tau$  for accurate estimates
- The bulk of the quasar population is 1 < z < 2

=> observed frame data needs to cover at least 3000 days for just the least massive systems

Also for:

- Accurate periods for LPVs
- Period changes in close binary systems, Blazhko RR Lyrae, ...





### The predictable sky

- Generative models of variability can be produced for every variable source in the sky
- Deep learning models are appropriate for both periodic sources and aperiodic or stochastic sources
- The expected behavior of each source could then be compared with the observed by ZTF
- This allows for much earlier detection of slow events such as:
  - Changing-look quasars
  - Microlensing
  - Slow flares/long-lived TDEs

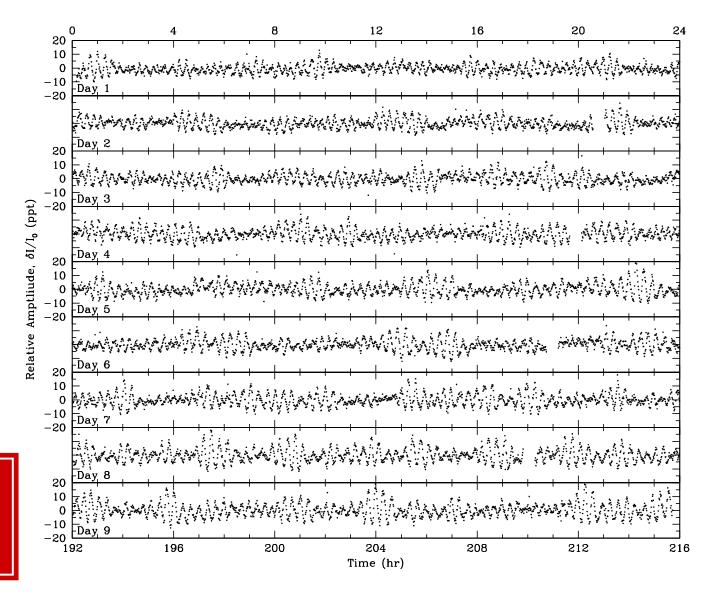


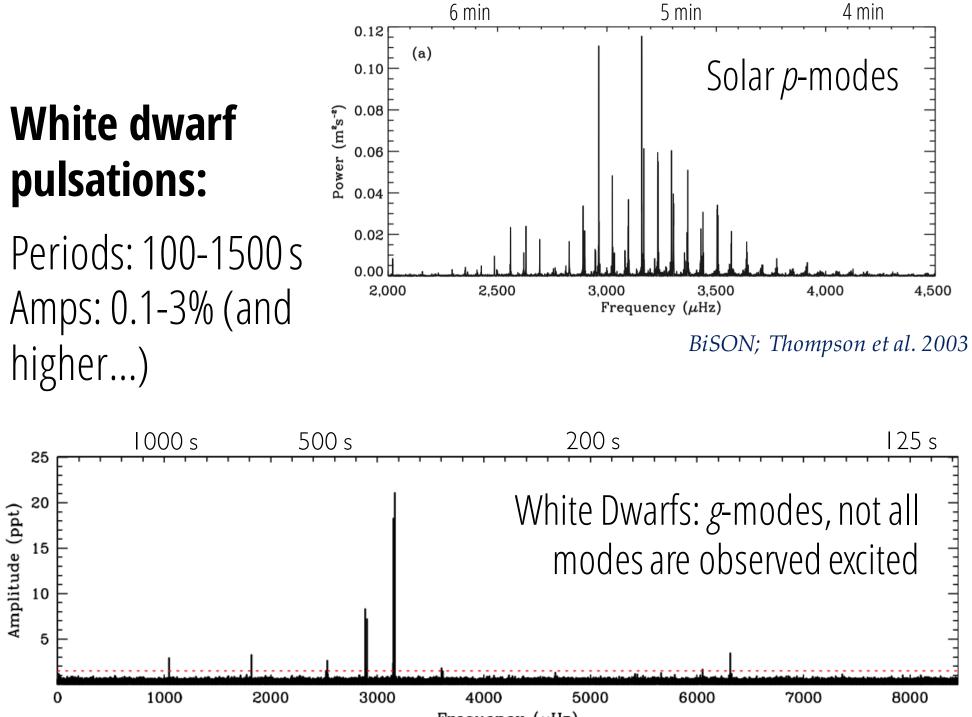
# Pulsating White Dwarfs from TDA Surveys

# J.J. Hermes

http://jjherm.es @jotajotahermes

**BOSTON** UNIVERSITY





Frequency  $(\mu Hz)$ 

# White dwarfs:

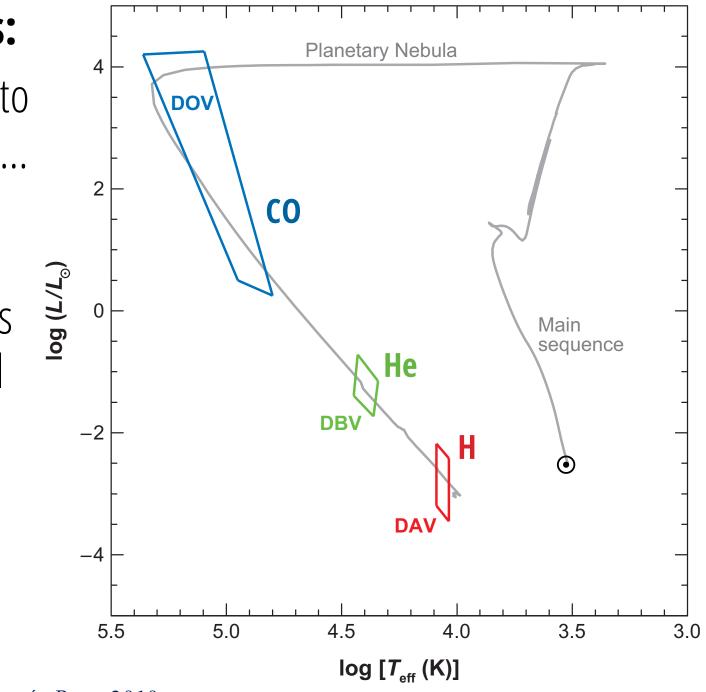
Peering 6 Gyr into our Sun's future...

non-radial gmode pulsations driven by partial ionization of **He** or **H** 

See reviews by:

Winget & Kepler 2008

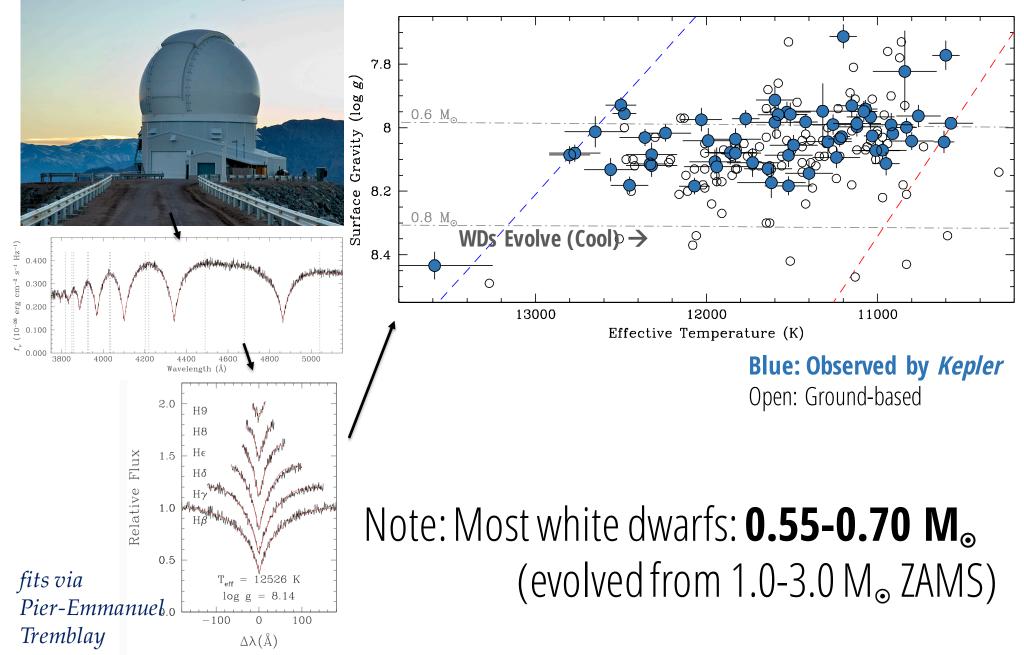
Fontaine & Brassard 2008



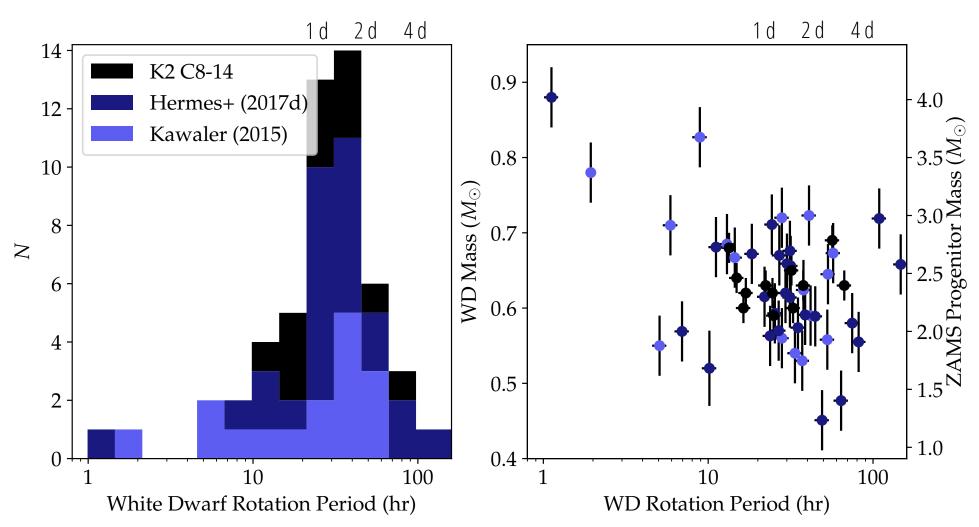
Althaus, Córsico, Isern & García-Berro 2010

### Spectroscopy of DAs (Hatm.) Yield Atmospheric Params.

#### 4.2m SOAR telescope

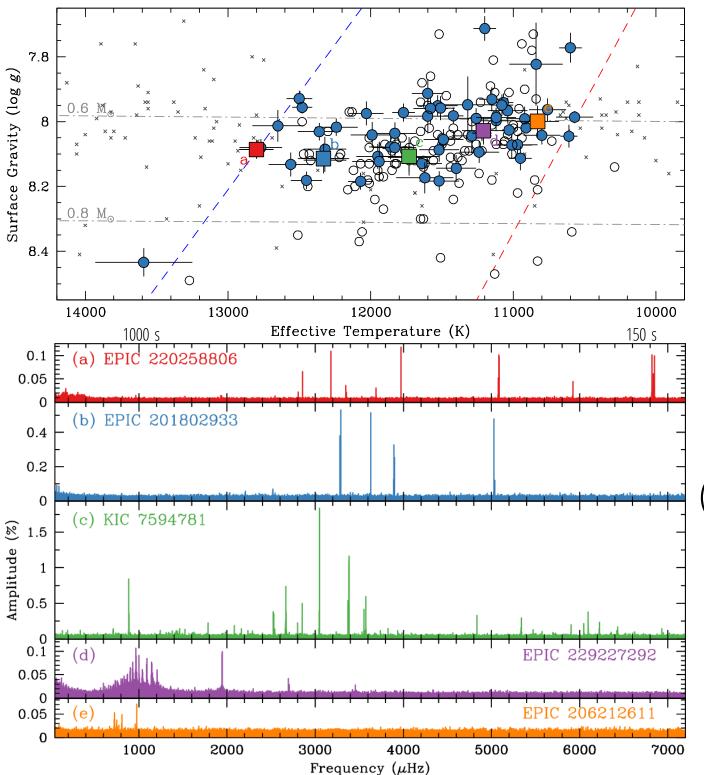


### Pulsations Give Rotational Splittings; Joined w/ Spectra We Finally Have WD Rotation Rates as Function of Mass



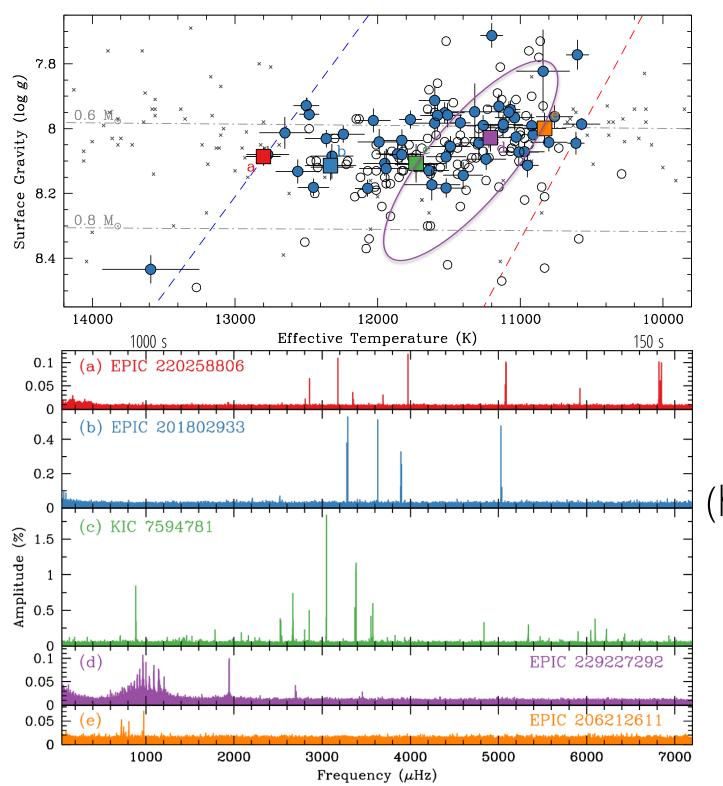
**Most white dwarfs evolve** from 1-3  $M_{\odot}$  ZAMS stars, and rotate with periods of 0.5-2.2 days

Hermes et al. 2017



# as white dwarfs **cool**:

### **convection zone deepens** and **longer-period** (higher-radial-order) pulsations driven



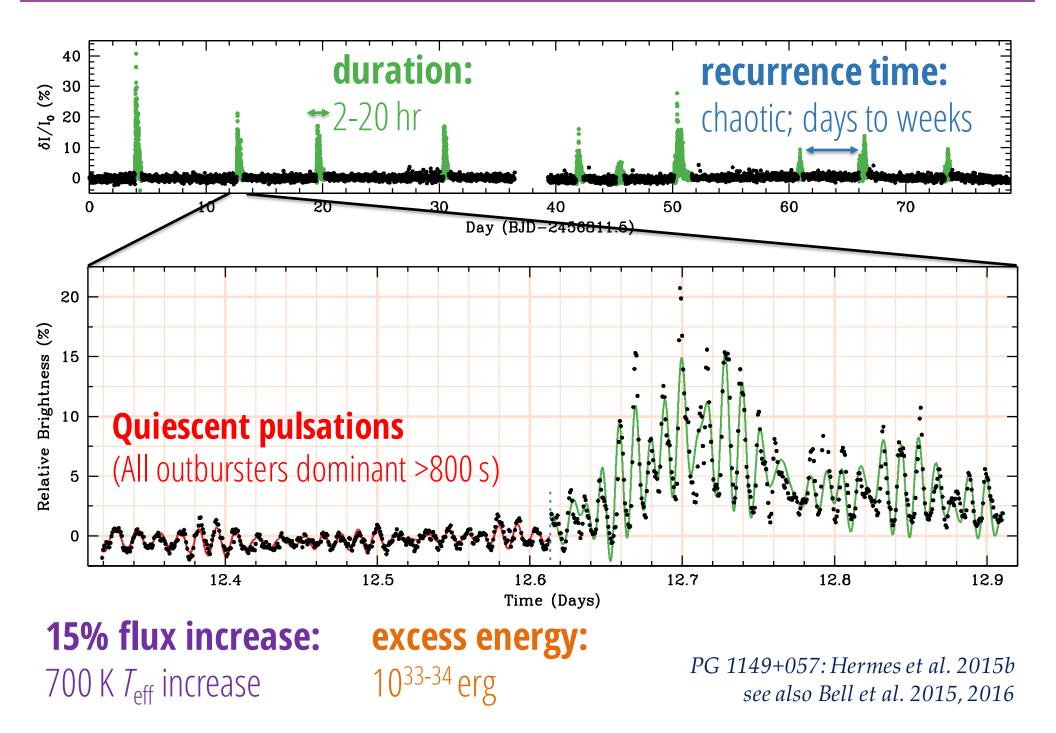
# as white dwarfs **cool**:

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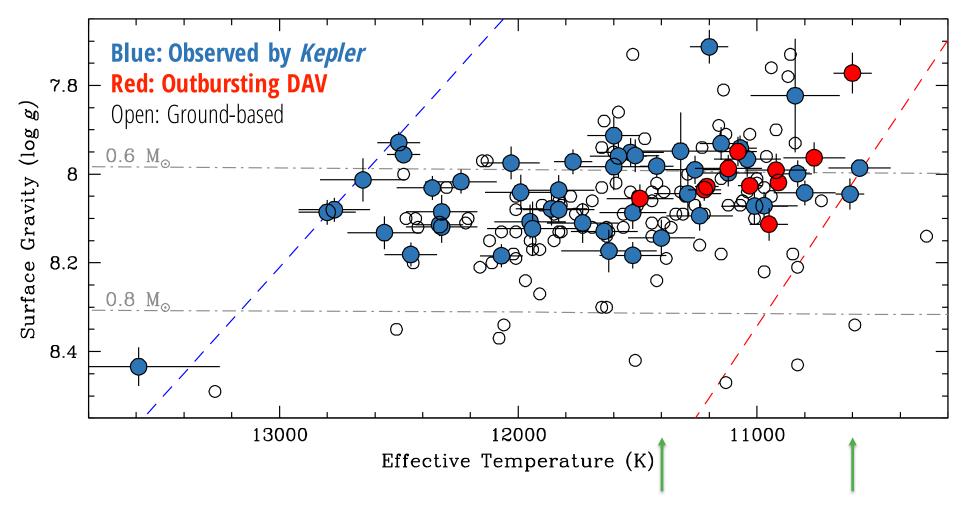
ations driven and

### **mode density** rapidly **increases**

### **Unexpected Outburst Phenomena in Pulsating WDs**



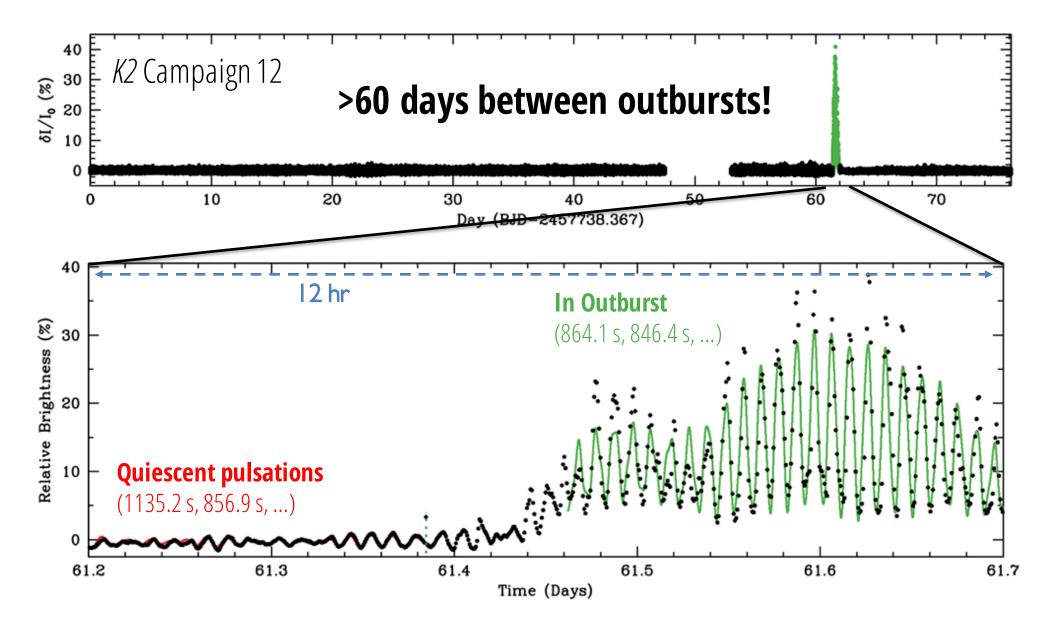
### **Outbursting DAVs are Among the Coolest DAVs**



more than 50% of DAVs from 11,200-10,600 K show **outbursts** in ~70 days of K2 monitoring

16/71 (>20% of) DAVs with Kepler data show outbursts

### GD 1212: The Brightest Outbursting White Dwarf

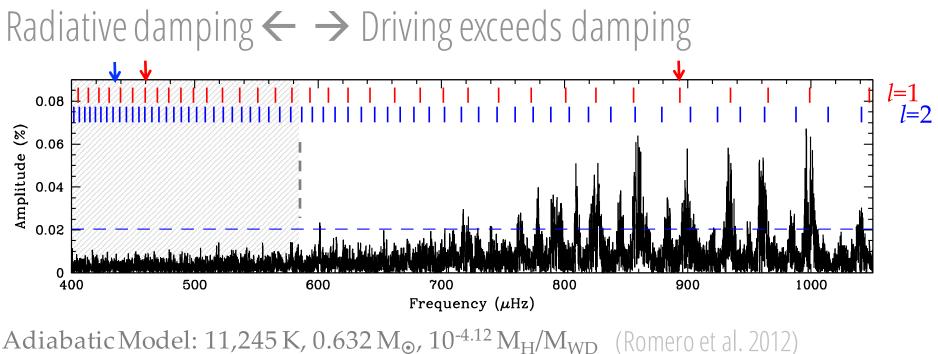


*GD* 1212 (*g*=13.2 *mag*): *Hermes et al.* 2019, *in prep.* 

### **Outbursts: Mode Coupling via Parametric Resonance**

**outbursts** are likely "**limit cycles** arising from sufficiently resonant **3-mode couplings** between **overstable parent** modes and pairs of radiatively damped **daughter modes**"

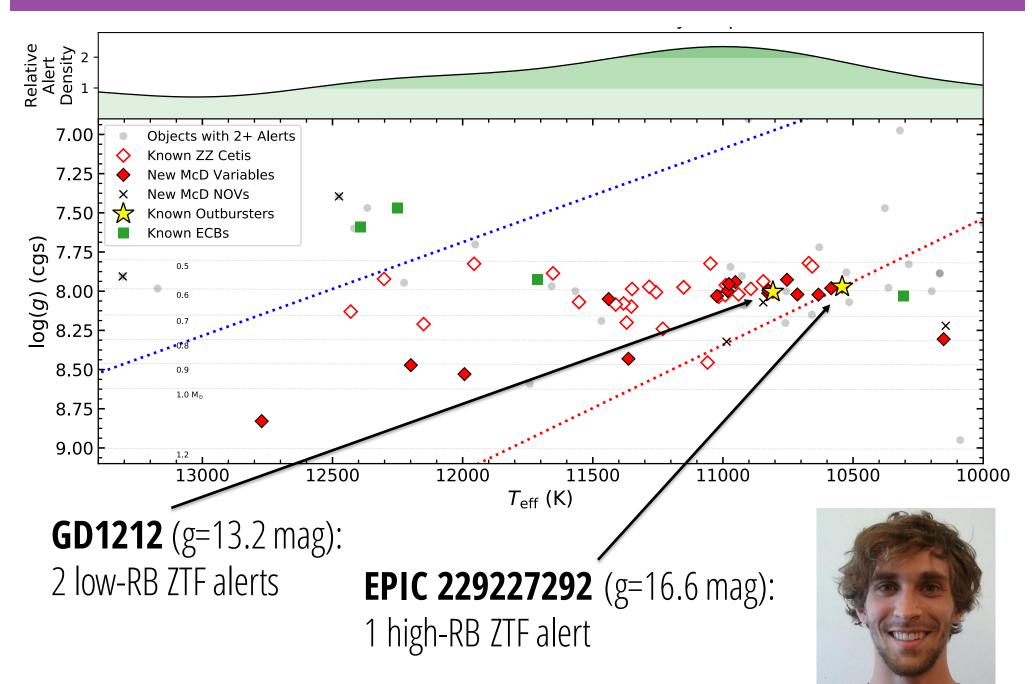
Luan & Goldreich 2018



Adiabatic Model: 11,245 K,  $0.632 M_{\odot}$ ,  $10^{-4.12} M_H/M_{WD}$  (Romero et al. 2012) Observed: 11,060(170) K,  $0.64(0.03) M_{\odot}$  (Gianninas et al. 2011)

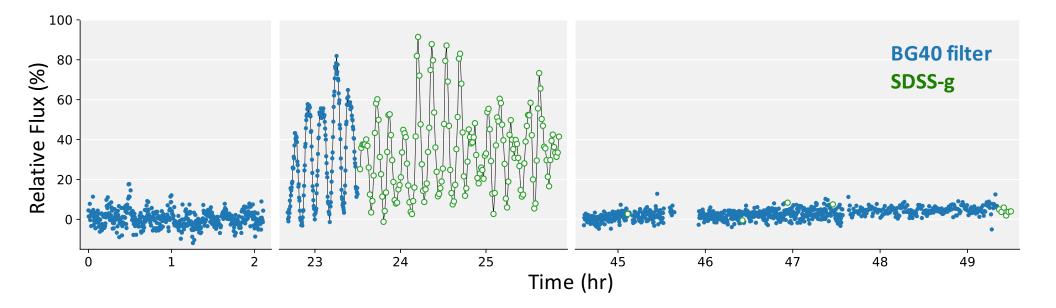
### What are surface temperatures and velocities in outburst?

### **Overdensity of ZTF Alerts Near Outbursting White Dwarfs**



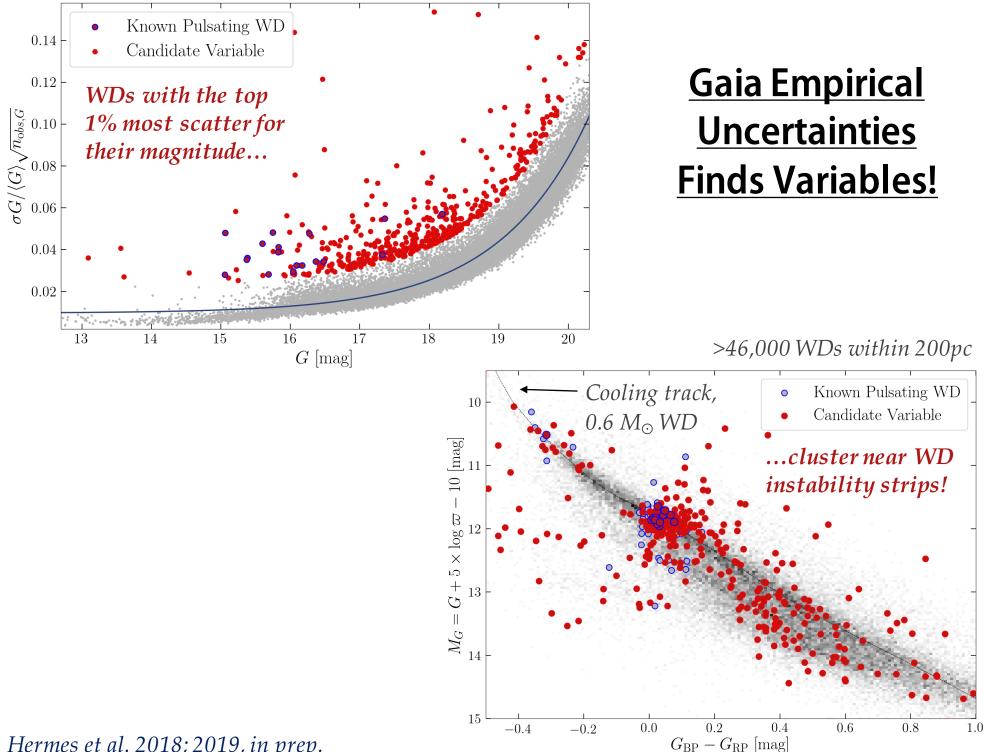
courtesy Zachary Vanderbosch (UT-Austin)

### **Outbursts Have Finally Been Detected from the Ground!**





Vanderbosch et al. 2019, in prep.



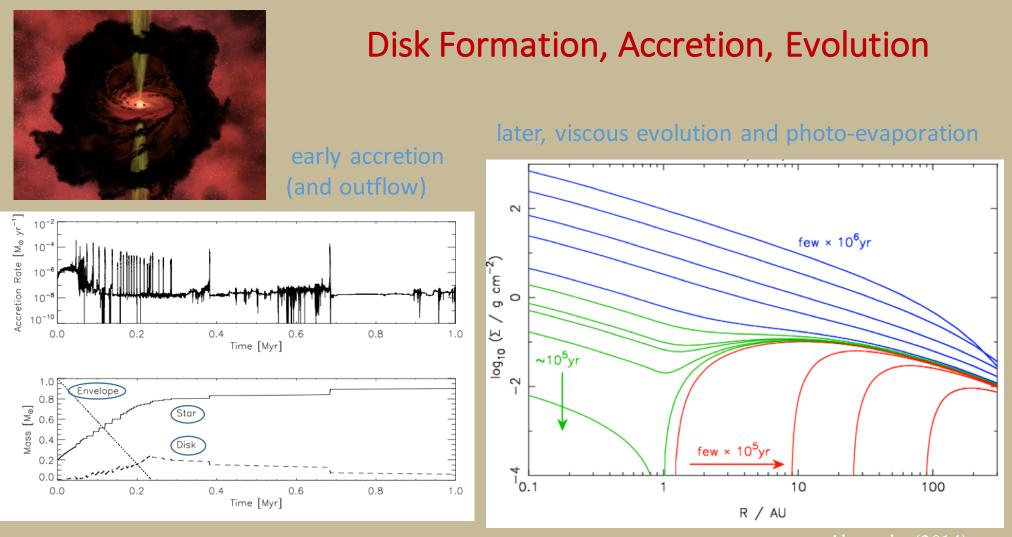
#### Hermes et al. 2018; 2019, in prep.

# Time Domain Surveys and Young Stars

Lynne A Hillenbrand Caltech

### Not Only Stars, but Planets being Born "Today"

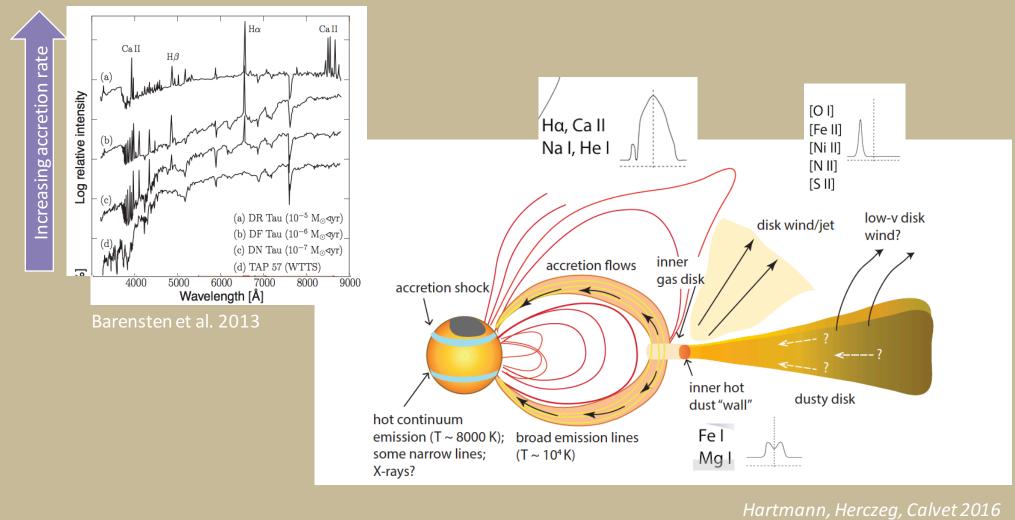




*Bae et al.* (2014)

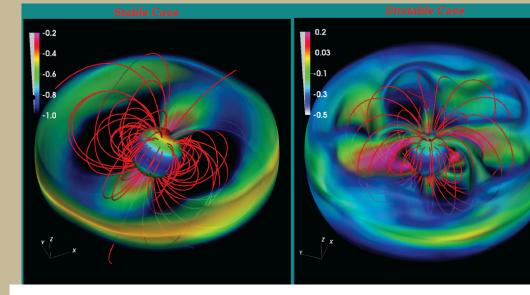
Alexander (2014)

### **Magnetospheric Accretion**



### Innermost disk regions, r < 0.05 AU

- Dynamical time at the co-rotation radius ~1 week
- Infall time along magnetic field lines ~hours



both accretion and ejection of material

Kurosawa, Romanova

Ń.

M<sub>win</sub>

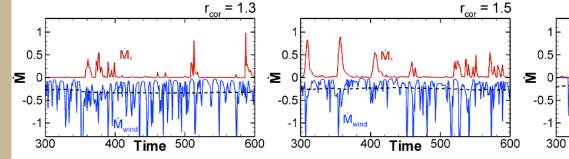
400

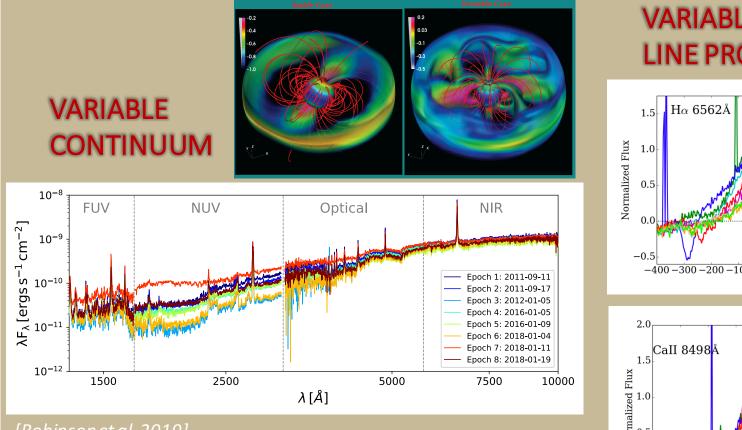
Time 500

 $r_{cor} = 2$ 

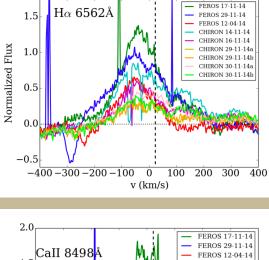
600

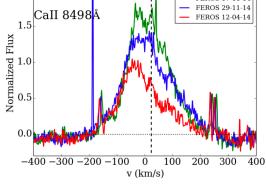
 $\langle \dot{M}_{wind} \rangle$ 





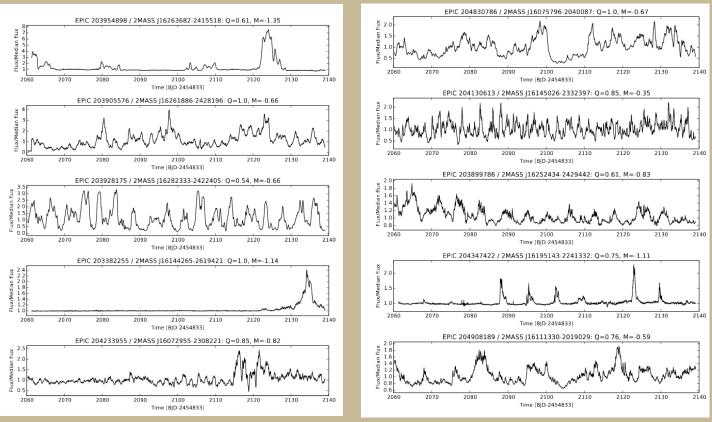
#### VARIABLE **LINE PROFILES**





#### VARIABLE BROAD-BAND PHOTOMETRY: ACCRETION-DRIVEN BEHAVIOR

#### [Cody et al. 2017]



14% of the objects with disks exhibit with these types of lightcurves

## A Range of Observing Strategies is Needed

- High precision
  - Underlying stellar processes e.g. pulsations, spots, rotation
  - Details of accretion-driven and extinction-driven behavior
- High cadence

CoRoT

K2

PTF/ZTF

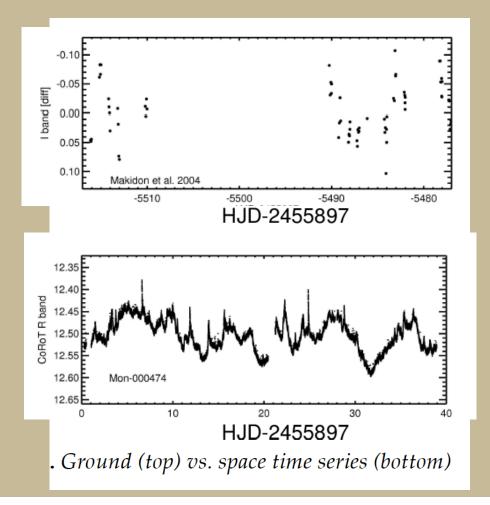
Gaia

Spitzer

NEOWISE

- Resolve the time scales for accretion and/or inner disk geometry changes
- Long duration (can be lower precision)
  - Probe more dramatic accretion and disk morphology history
- Multiwavelength
  - Importance of dust extinction vs gas accretion processes
  - Importance of radiative vs dynamic processes

## The Quality of Modern Data is Outstanding!



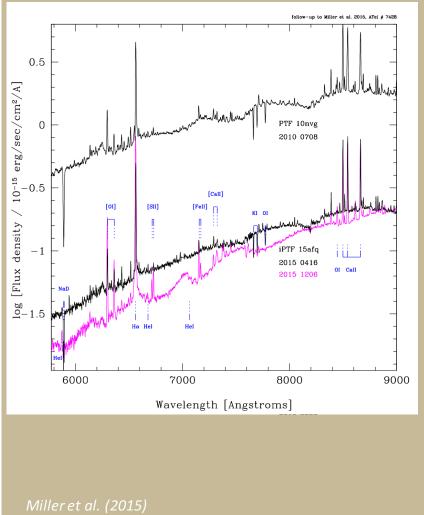
#### Ten to Fifteen years ago:

- ground-based
- precision-limited
- cadence-limited
- many gaps

#### Today:

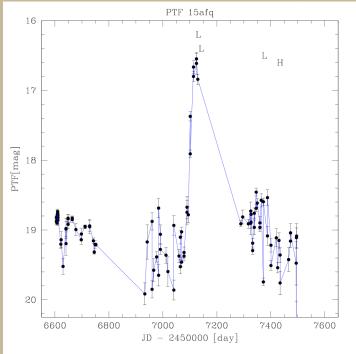
- space-based
- exquisite precision
- excellent cadence
- acceptable gaps

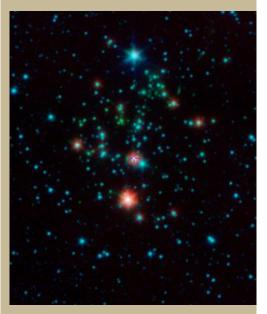
## A LARGE SHORT-LIVED ACCRETION BURST



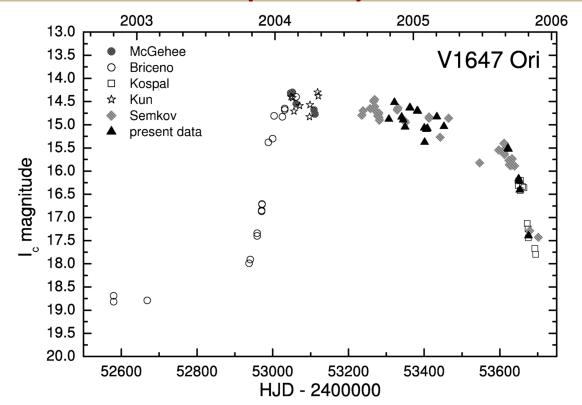
Increase in disk accretion rate caused ~3 mag brightening for several months accompanied by enhanced spectral veiling and TiO emission.

PTF 15afq





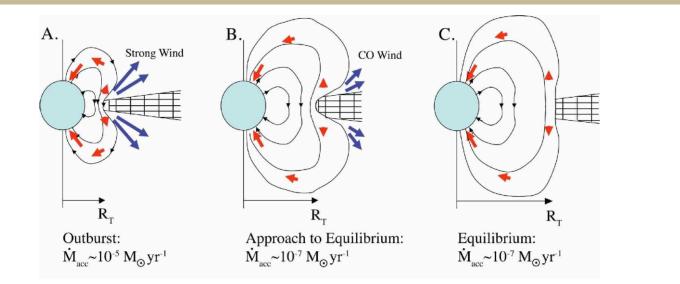
## A Somewhat Larger, Somewhat Longer-Lived, But Still Temporary Burst



**Figure 4.** V1647 Ori light curve in the  $I_C$  passband. Our data and data from McGehee et al. (2004), Briceño et al. (2004), Kóspál et al. (2005), Kun et al. (2004) and Semkov (2004, 2006) were used.

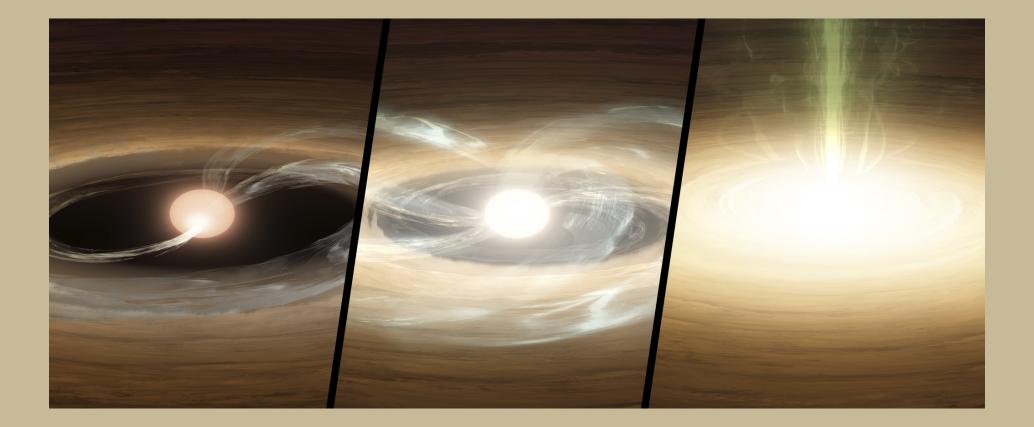
## **Innermost Disk Instabilities**

magnetospheric instability e.g. Goodson & Winglee (1999)



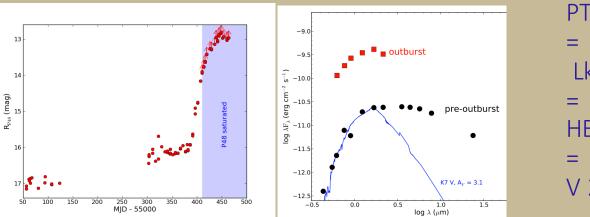
**Fig. 6** Schematic model of an Exor V1647 Ori. During the outburst the accretion rate is enhanced so that the magnetospheric radius  $R_m$  decreases and the magnetic field lines were bunched (A). This results in a fast, hot outflow. As the accretion rate decreases, the disk moves outward and this results in a slower, cooler CO outflow (B). Further decrease in the accretion rate leads to a quiescence state where the production of warm outflows stops (C). From Brittain et al. (2007).

## Extreme Outbursts = FU Ori Stars

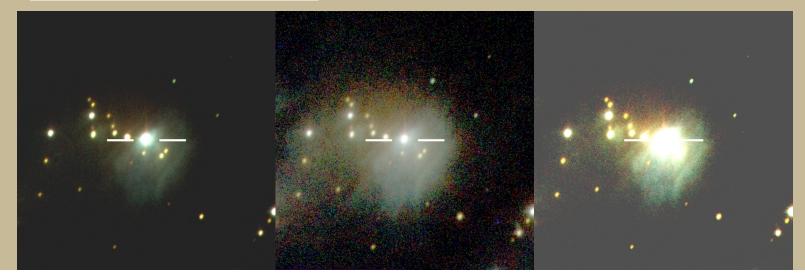


## Witnessing an FU Ori Outburst (PTF)

Miller et al. (2011)

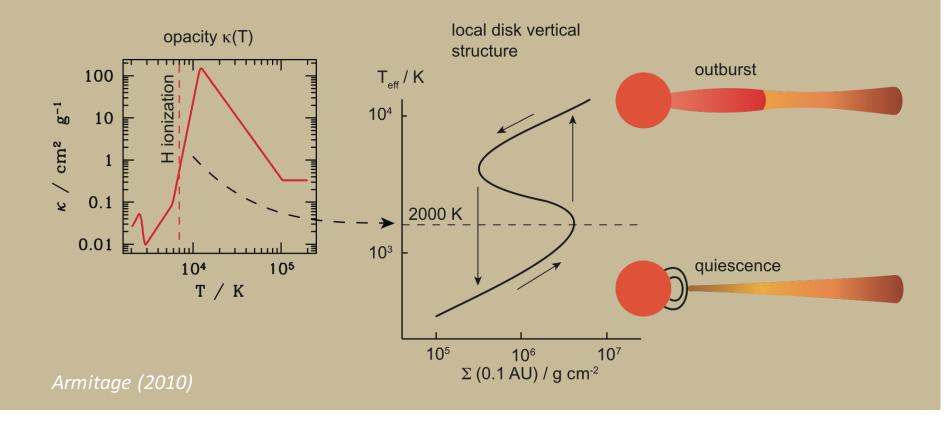


PTF10qpf = LkHa 188/G4 = HBC 722 = V 2493 Cyg



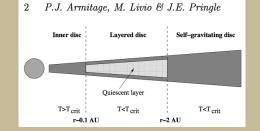
## **Broader Disk Instabilities**

classical thermal instability driven by change in kappa e.g. Bell & Lin (1994)

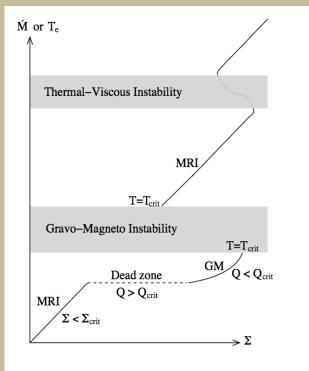


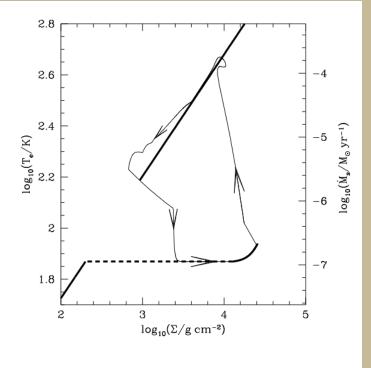
## **Broader Disk Instabilities**

- Magneto-rotational instability, driven by
  - change in ionization e.g. Balbus & Hawley (1991)
  - change in alpha e.g. Zhu et al
- Gravitational instability driven by accumulation of mass
- → Gravo-magneto instability studied by Martin & Lubow (2011)

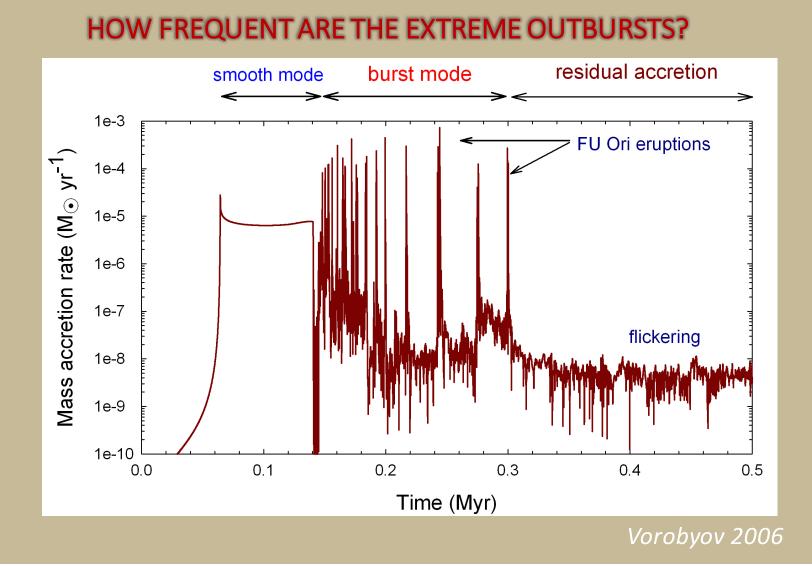


#### Armitage (2010)





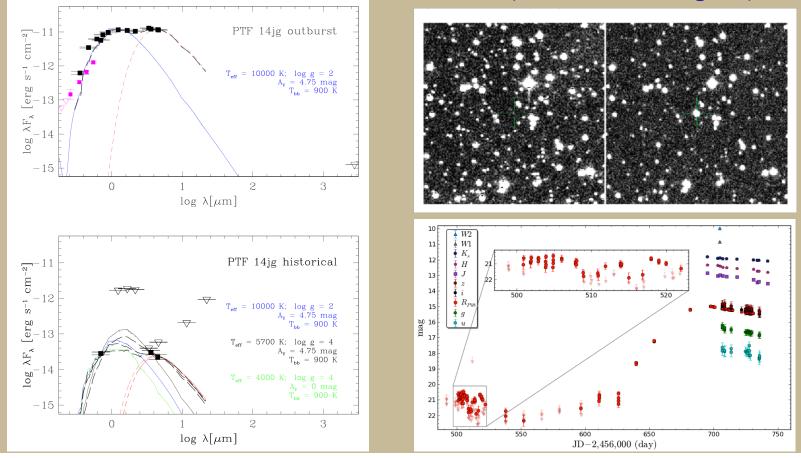
tic diagram of steady disk solutions in the  $\Sigma - \dot{M}$  plane at some radius in



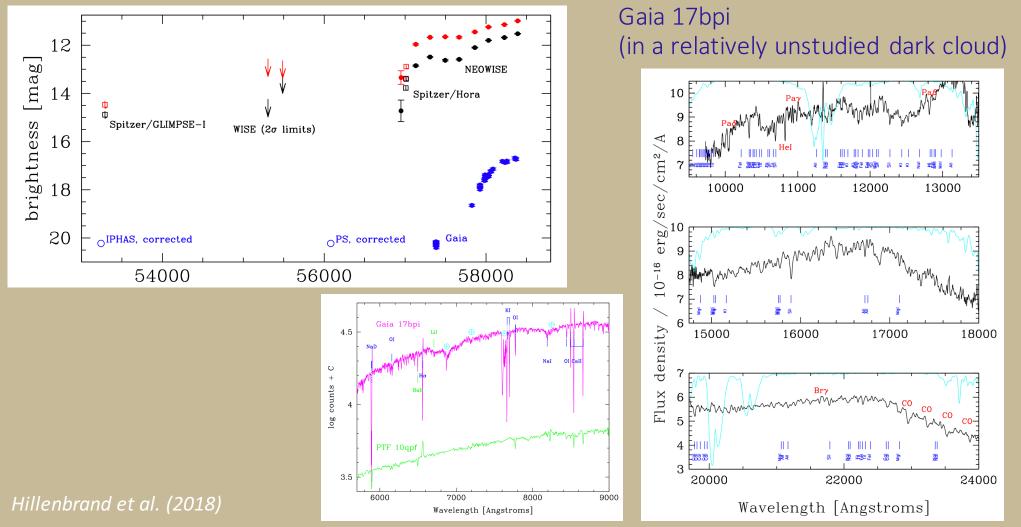
## Another PTF-Discovered Likely FU Ori Event

#### Hillenbrand et al. (2019)

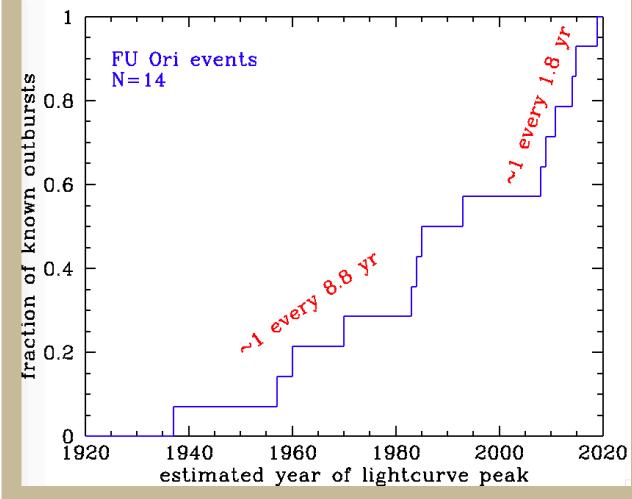
#### PTF14jg (near W4 HII region)



## A Gaia-Discovered FU Ori Star

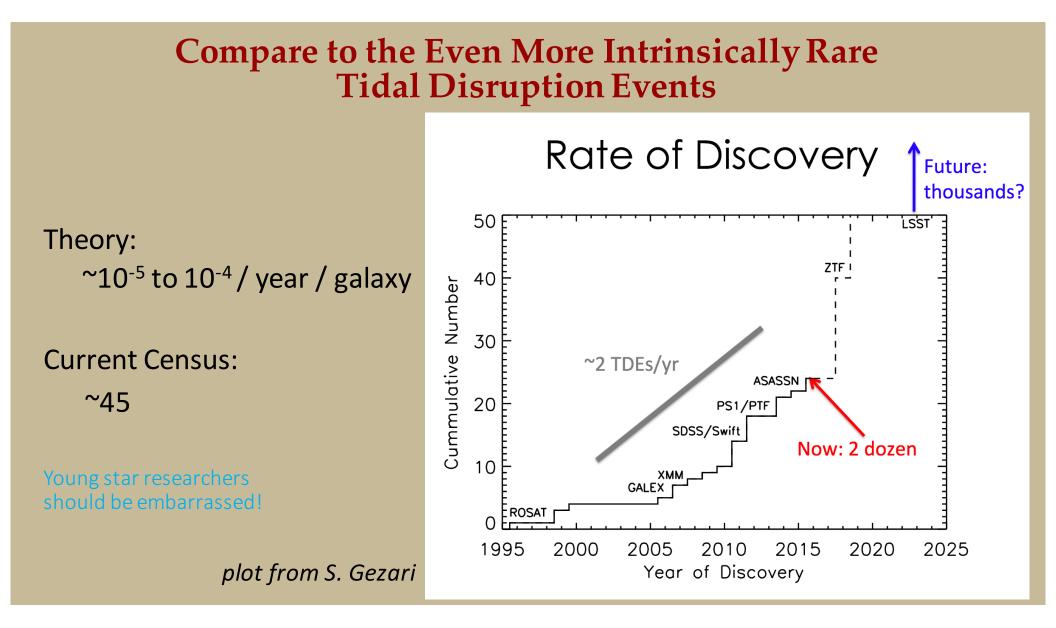






Only 14 outbursts actually observed in the act (out of a total sample of only ~25 !)

- Though we appear to be getting better at noticing outbursting young stars, undoubtedly, we are not finding them all.
- In order to estimate the outburst rate – as distinct from the detection rate – we need to understand our efficiency (or better stated, inefficiency).
- Rate estimation is difficult without more complete young star census information.



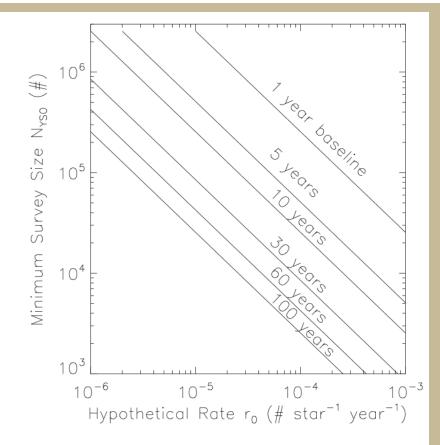


FIG. 2.— The survey size needed to have a 90% chance of constraining the outburst rate to a factor of 2 at 90% confidence, as a function of the true outburst rate  $r_0$  (abscissa) and the time baseline (labels). One may reduce the needed survey size by choosing a longer time baseline, by admitting higher uncertainty than a factor of 2, or by requiring a lower confidence than 90%. **Constraining the Rate of FU Orionis Outburst Events** 

Need to know the numerator.

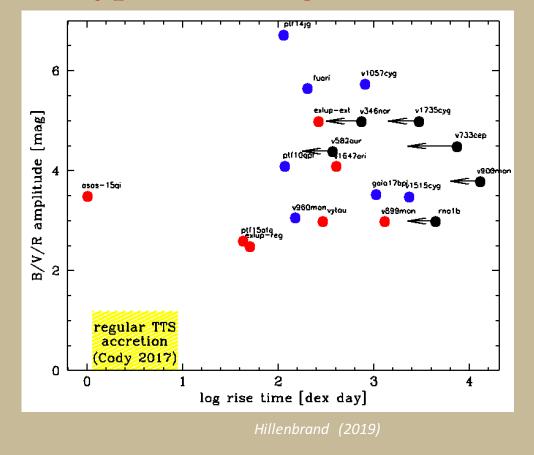
Need to know the denominator.

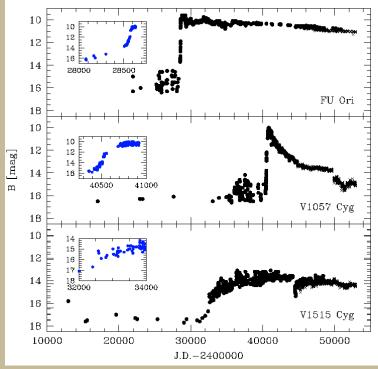
Need to have enough stars for meaningful statistics!

Hillenbrand and Findeisen (2015)

### How Can we Recognize True FU Ori Events

vs other Types of Young Star Outbursts?

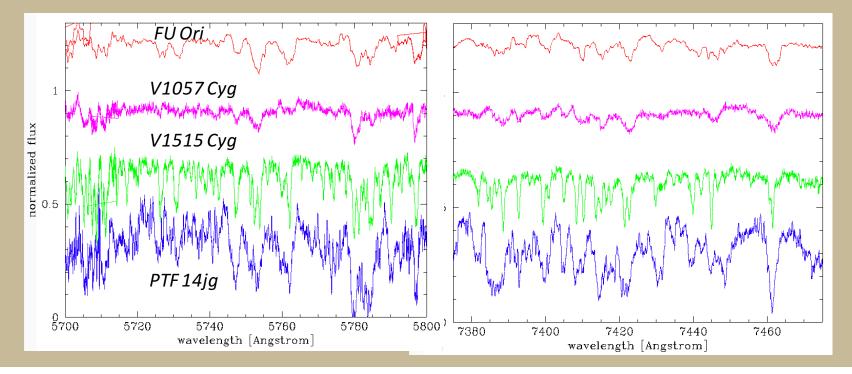




Measuring the duration of an outburst usually requires impatient people to wait.... - G. Herczeg

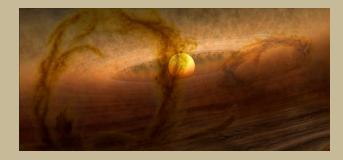
#### How Can we Recognize True FU Ori Events vs other Types of Young Star Outbursts?

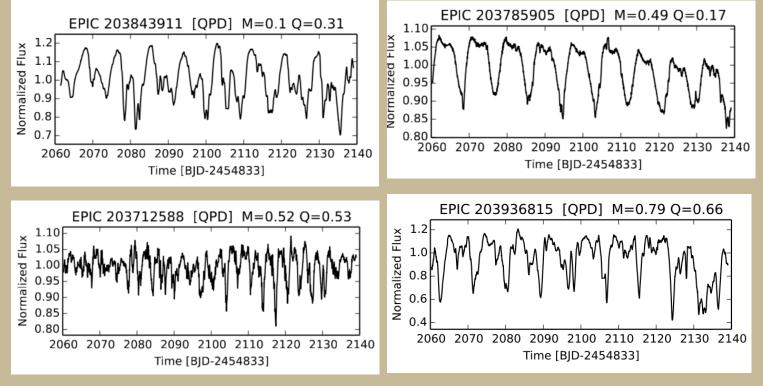
High Dispersion SPECTRA → disk photosphere (composite, not single-temperature)



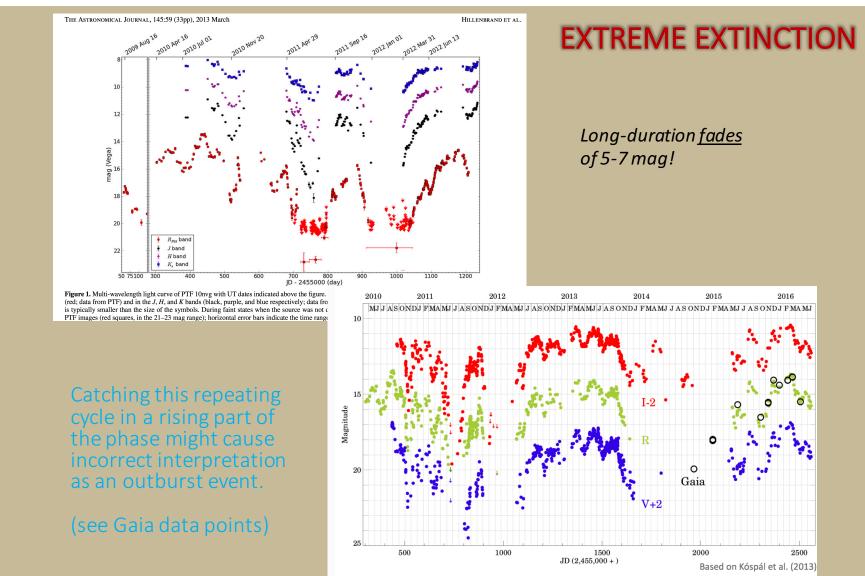
### VARIABLE PHOTOMETRY: EXTINCTION-DRIVEN BEHAVIOR

#### [Cody et al. 2018]



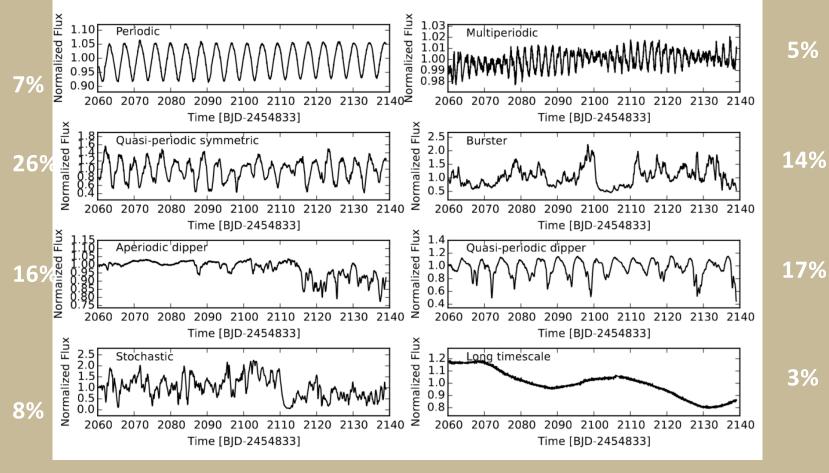


33% of the objects with disks exhibit with these types of lightcurves



Ágnes Kóspál: Observational properties of outbursting sources

#### LIGHTCURVE MORPHOLOGY CLASSIFICATION



Cody and Hillenbrand

#### LIGHTCURVE MORPHOLOGY CLASSIFICATION

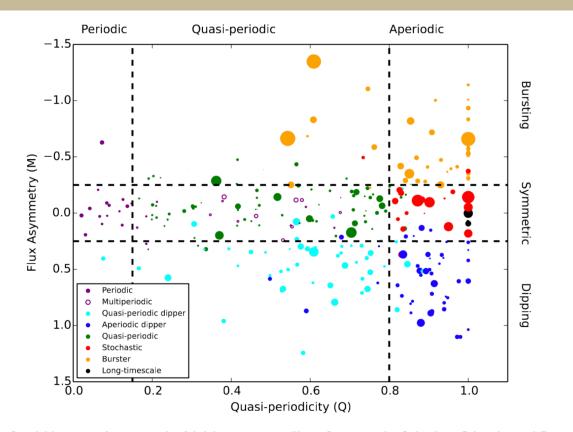
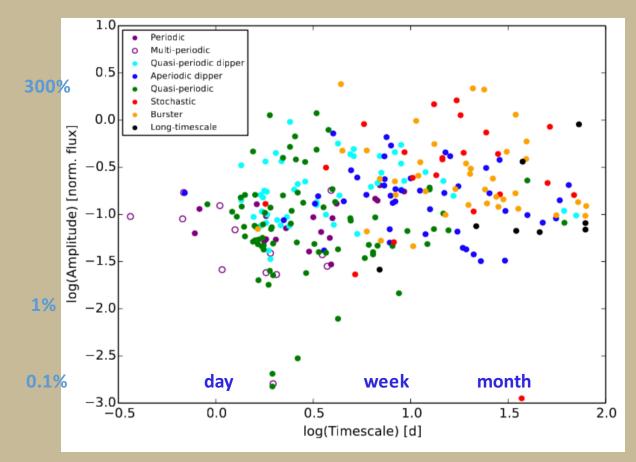


FIG. 6.— Q and M statistics for our sample of disk-bearing stars in Upper Scorpius and  $\rho$  Ophiuchus. Colors denote different types of variables, as identified by eye. Non-variable objects are excluded. Point sizes in this and subsequent plots are scaled according to variability amplitude.

Cody and Hillenbrand (2018)

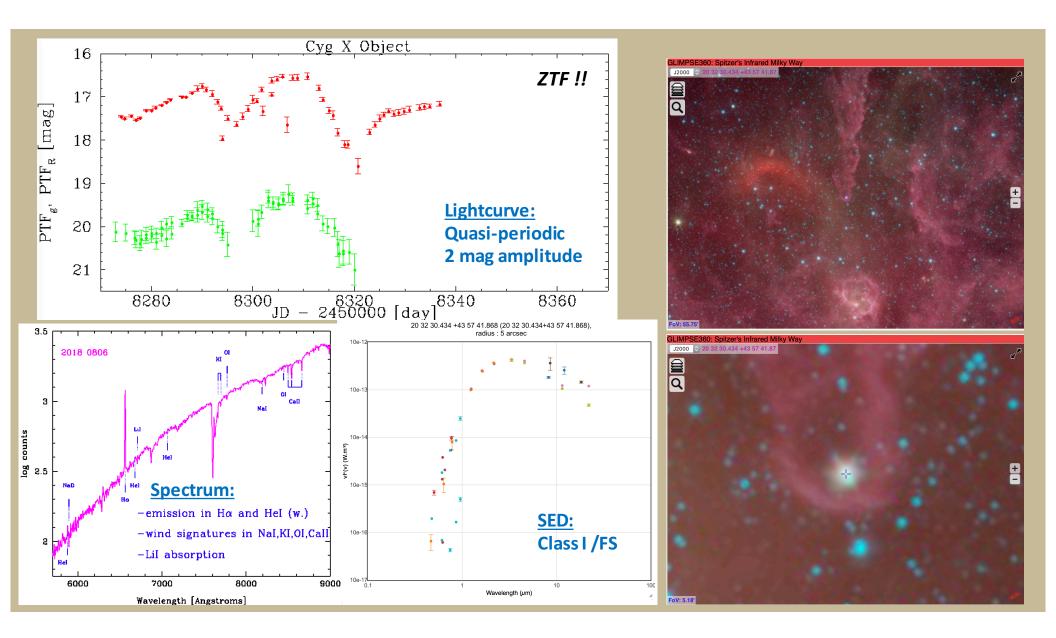
#### TIMESCALES AND AMPLITUDES



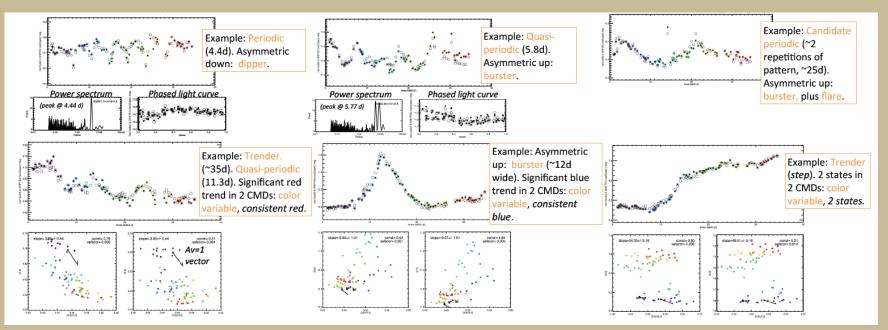
Cody and Hillenbrand (2018)

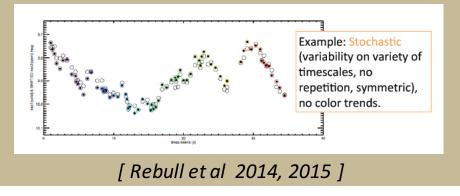
Amplitude ranges of most disk categories are similar. <u>Timescales</u> vary, however: Long = Bursters, Stochastics Aperiodic Dippers Int = Quasi-periodic Dippers Quasi-periodic Symm.

Short = Periodic Multi-Periodic



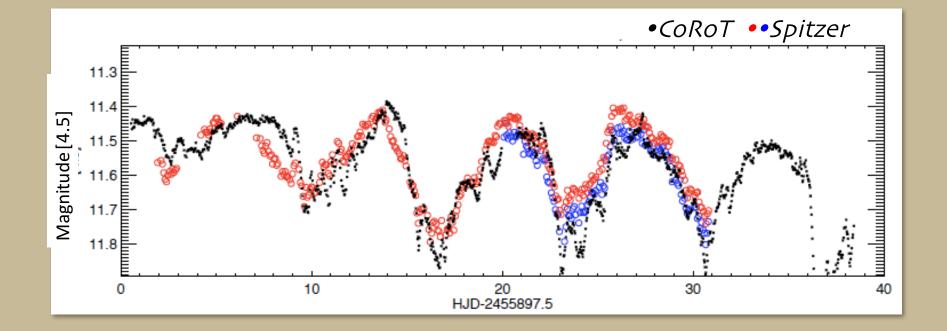
### Infrared Variability Too (Spitzer)



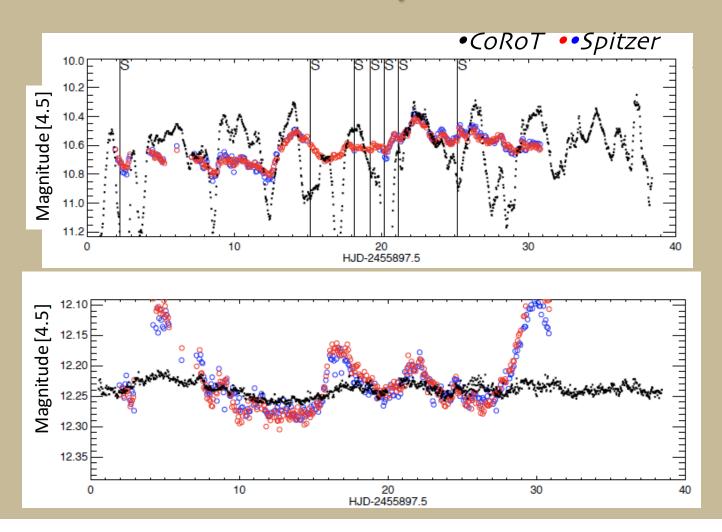


- ~50% of identified variables also vary in color
- ~33% are periodic
- ~25% "dip" and ~25% "burst"
- ~50% "trend" over a month
- ~20% "stochastic"

## **Optical and Infrared Sometimes Quite Similar**



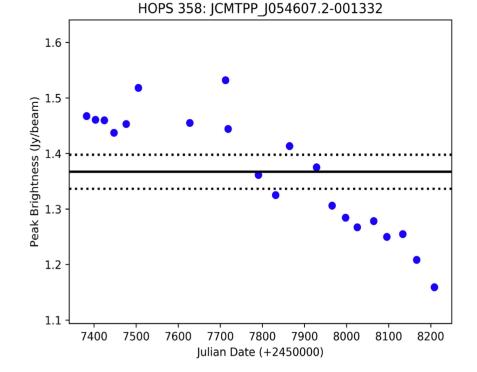
## **Sometimes Very Different**



### Even Sub-millimeter Variability is Observed!

850 Microns (JCMT) 1.4 1.3 Flux (Jy/beam) 1.2 1.1 1.0 0.9 7800 7900 7400 7500 7600 7700 8000 8100 8200 JD (2450000+)

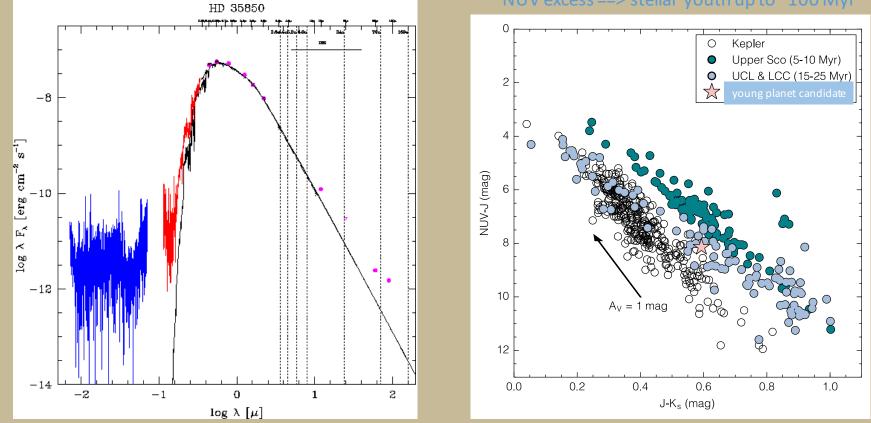
EC53 850 Micron Lightcurve



The 850 micron light curve of EC 53 obtained by the Submillimetre COmmon User Bolometer Array 2 (SCUBA-2) at the JCMT. The dashed lines show the x-axis boundaries for the infrared data presented below. For more information about the variability of EC 53, see <u>Hodapp et al. 1996, ApJ: 468:861</u>, <u>Hodapp et al. 2012, ApJ:</u> 744:56, Yoo et al. 2017, ApJ: 849:69, and <u>Mairs et al. 2017, ApJ: 849:107</u>. For more information about the Transient Survey and how this light curve was generated, see <u>Herczeg et al. 2017, ApJ: 849:43</u>, <u>Mairs et al.</u> 2017, ApJ: 843:55, and Johnstone et al. 2018, ApJ: 854:31.

Figure 17. Secular Variables. Linear fits are performed for light curves and the significance of their slopes are tested by team members. HOPS 358 was the subject of a recent ATel released by the Transient Team (see text).

## **Post-Accretion Pre-Main Sequence Star SED**



#### NUV excess ==> stellar youth up to ~100 Myr

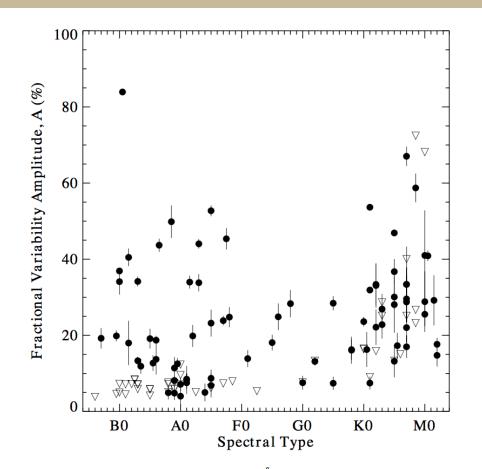
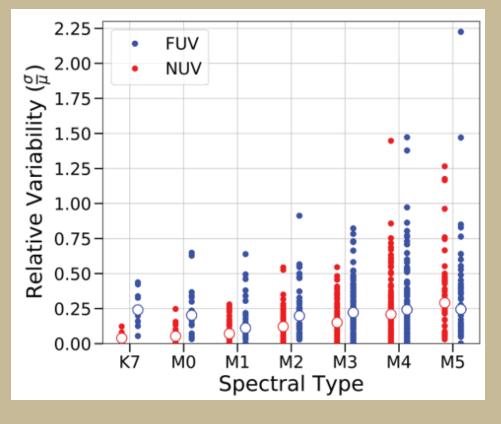
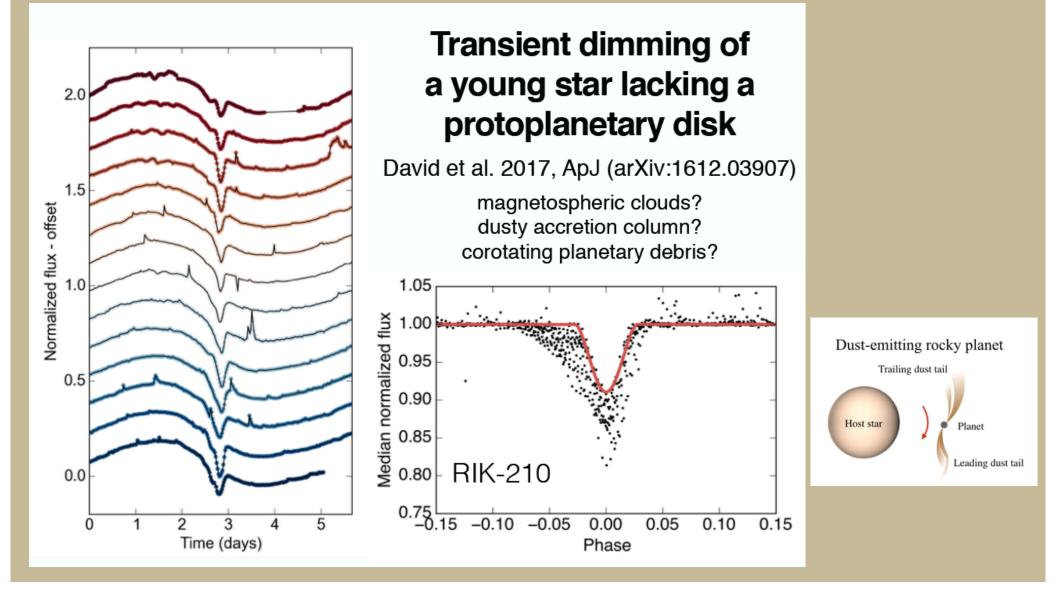


FIG. 9.—Mean deviation in 1900–3200 Å flux, relative to the global mean for all spectra of a given PMS star. Triangles indicate  $2\sigma$  upper limits. Only stars observed more than once by *IUE* are shown. Few PMS stars of spectral class F were observed by *IUE*, but LW data are adequate to show that they can vary significantly.

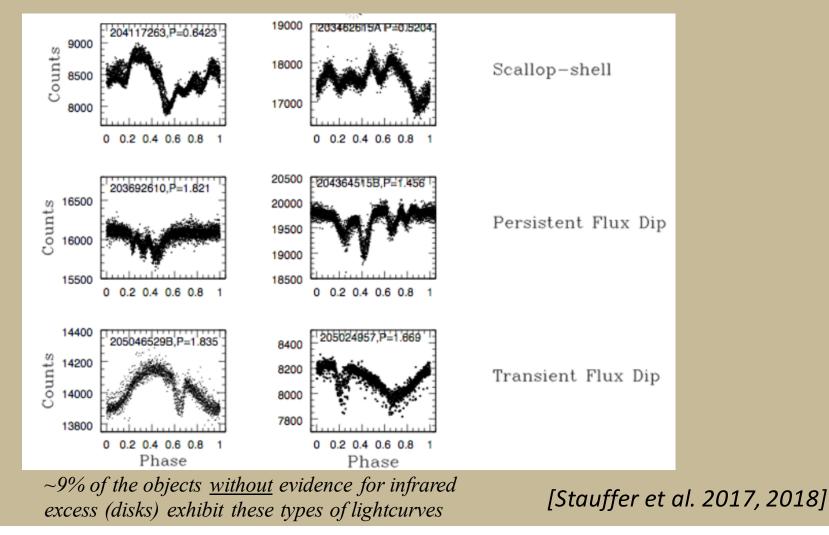
Much larger ultraviolet variabiliy amplitudes compared to regular active late-type stars in the field (2-800x).



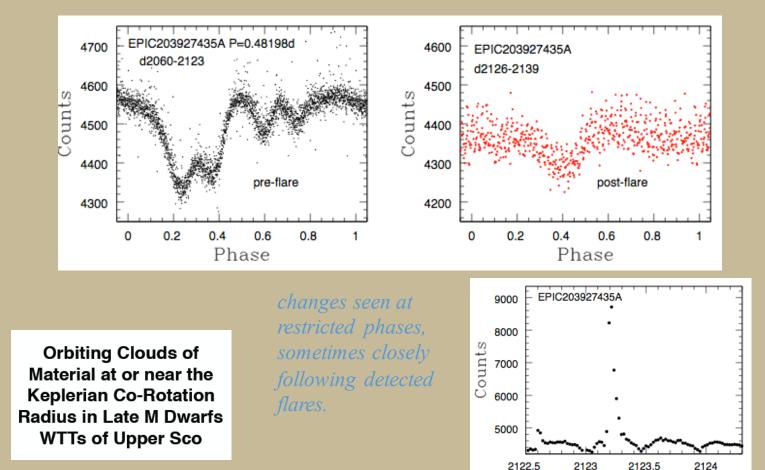
Shkolnik 2018



### More Interesting Co-Rotating Structure



### Waveform Can Change During the ~80 Day K2 Campaign



Time (days)

[Stauffer et al. 2017]

GW170817: FIRST COSMIC EVENT OBSERVED IN GRAVITATIONAL WAVES AND LIGHT



# Mansi M. Kasliwal

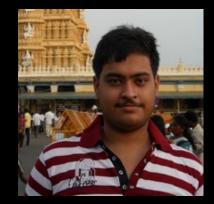
#### ASSISTANT PROFESSOR OF ASTRONOMY CALIFORNIA INSTITUTE OF TECHNOLOGY



### Kasliwal Research Group



Jacob Jencson (Grad, 5<sup>th</sup> Year)



Kishalay De (Grad, 3<sup>rd</sup> Year)





Samaporn Tinyanont Shreya Anand (Grad, joint w/ Mawet) (Grad, joint w/ Weinstein)



Scott Adams (Postdoc)







Matt Hankins (Postdoc)

Christoffer Fremling (Postdoc, joint w/ SRK)

Igor Andreoni (Postdoc)

Alumni: Ragnhild Lunnan, Dave Cook, Ryan Lau, Nadia Blagorodnova, Stephanie Kwan, Lindsey Whitesides, Viraj Karambelkar, Chris Cannella

#### Multi-Messenger Astrophysics Discovery Engines

Gravitational Waves: LIGO, Virgo, LIGO-India, Kagra, LISA, PTA

Neutrinos and UHECRs: Icecube, Pierre Auger, Antares, SuperK

Optical: Evryscope, ASASSN, HATPI, ZTF, KMTNet, CSS-II, PS2, Blackgem, ATLAS, DECAM, HSC (and soon, LSST) Gamma-Rays Fermi, Swift, Integral X-ray: MAXI, eROSITA Radio: LOFAR, MWA, LWA, Apertif, Meerkat, Askap, CHIME, VLASS

#### MISSING: Wide-field Infrared and Ultraviolet

### Why Infrared Fireworks?

- I. Nuclear Physics
  - Heavy Element Opacity cf Kilonovae & Gravitational Waves
  - Line Blanketing cf He-shell detonations cf LISA GW

### II. Enshrouded Stellar Fates

- Milky Way Dust cf Galactic Supernova & Neutrinos
- Mass-loss self-obscuration cf core-collapse supernovae

### III. Cool Explosions

- Birth of Stellar Black Holes
- Stellar Mergers
- Shocks in Classical Novae

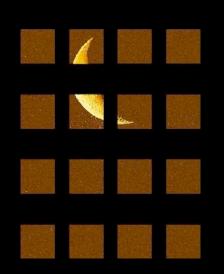
#### IV. The Unexpected

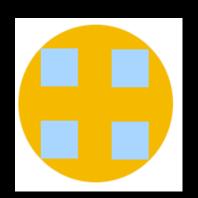
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### The Dynamic Infrared Sky is Relatively Pristine

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### No Wide-Field IR cameras?

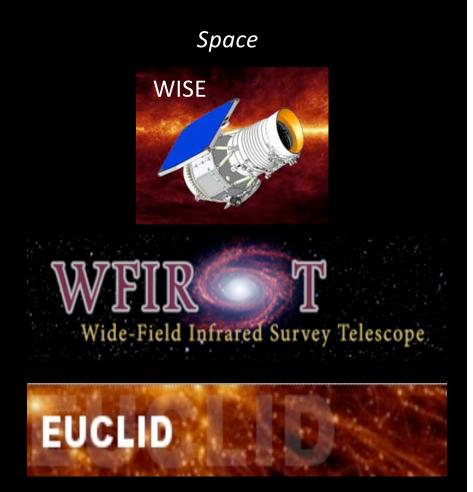




WFCAM on UKIRT 0.2 deg<sup>2</sup> on 4m

VIRCAM on VISTA 0.6 deg<sup>2</sup> on 4m

WIRCAM on CFH 0.13 deg<sup>2</sup> on 4m



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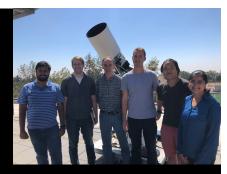
### IR TDA Roadmap

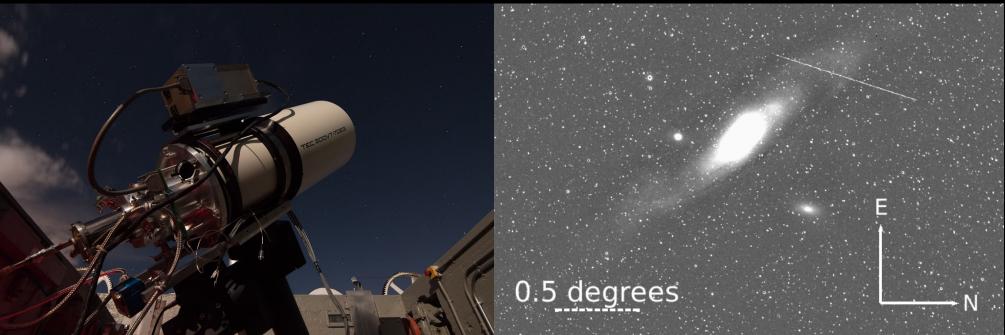
	Project	Description	Status
Phase I	SPIRITS	Target 200 galaxies with the Spitzer Space Telescope	2014-2019 Ongoing
Phase II	ZTF	Classify the reddest optical transients	2018-2020 Ongoing
Phase III	Palomar Gattini-IR	15,000 sq deg every night in J-band to 16.4 mag	Sep 11, 2018 First Light
Phase IV	WINTER	1 sq deg yJH camera on a 1 meter telescope	Summer 2020 Just Funded

And then perhaps, go to a Polar Location or Space...

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#### Palomar Gattini-IR: Opening up the dynamic infrared sky



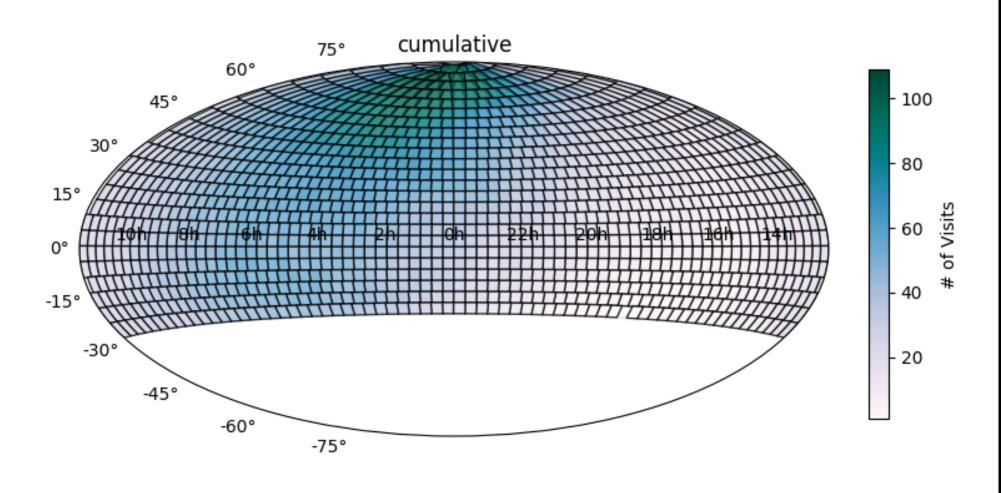


A robotic 30cm telescope with a 25 sq deg FoV camera Surveys 9,000 sq deg to J < 15.4 mag every single night! In partnership with Anna Moore (ANU)

First light: September 11, 2018

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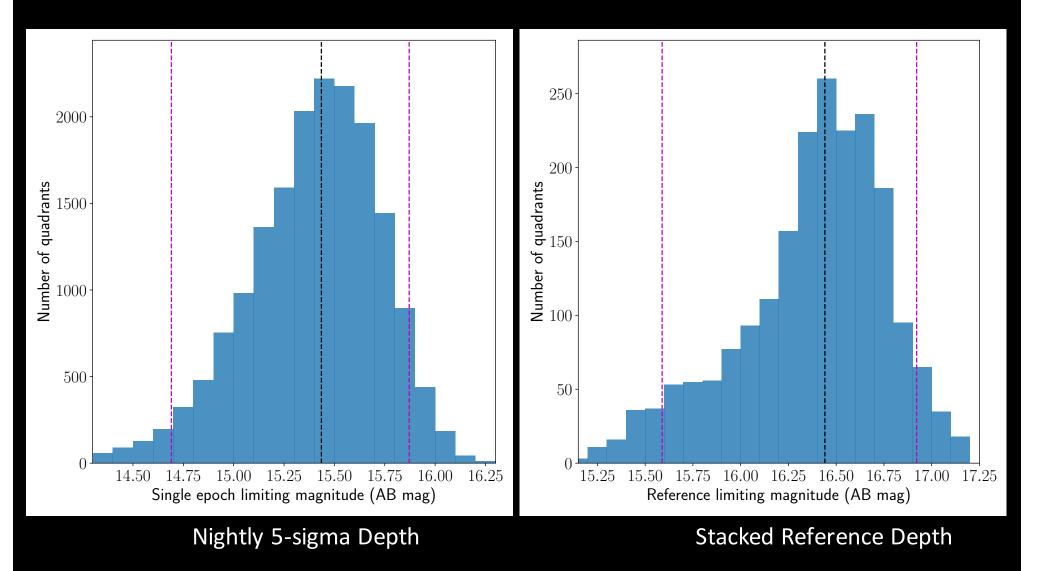
### Sky Coverage to date



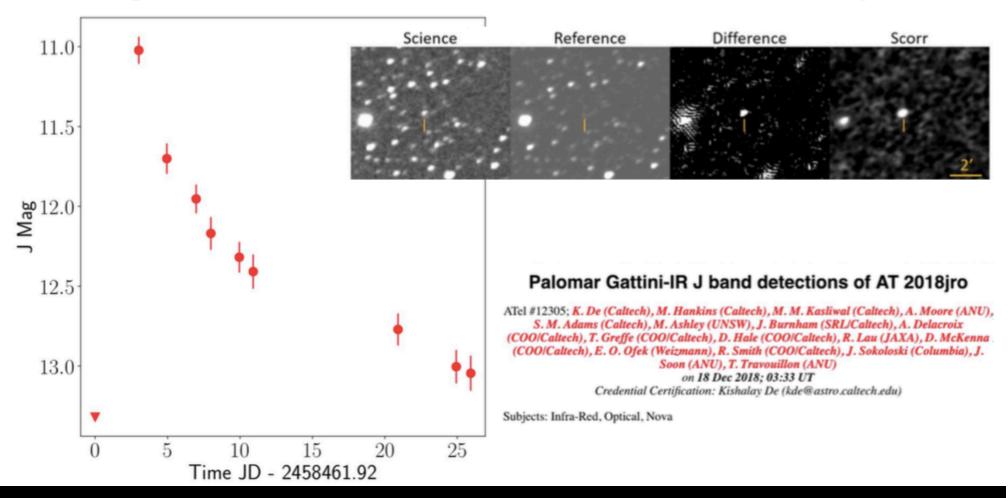
~9000 square degrees mapped every night!

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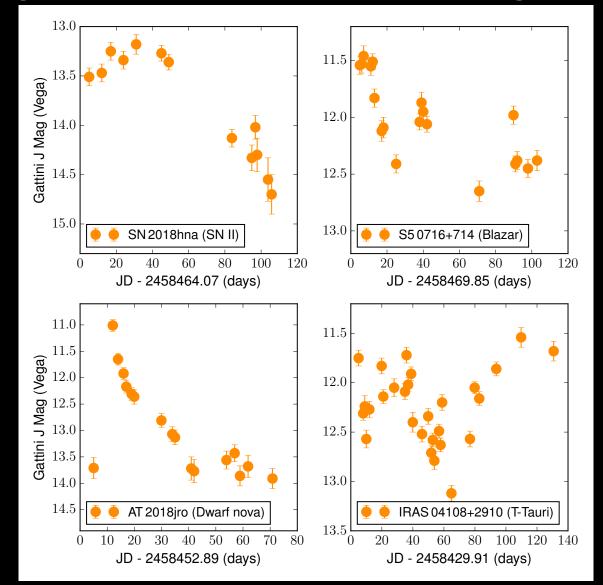


### Light curve of dwarf nova AT 2018jro



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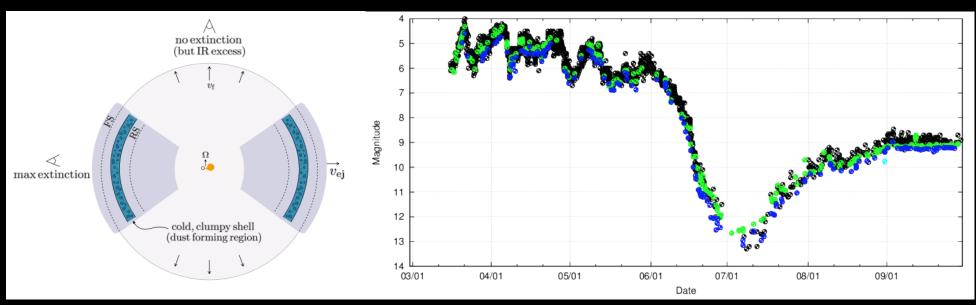
#### Collage of Palomar Gattini-IR light curves



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February 27, 2019

#### Classical Novae: Shock-Dust Connection?



Derdzinski et al. 2016

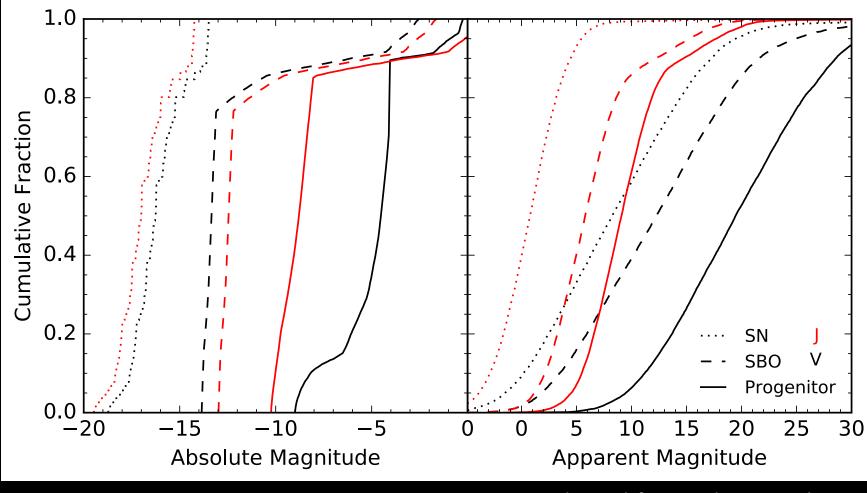
Dust Dip from V5668 Sgr/AAVSO

In partnership with Jeno Sokoloski.



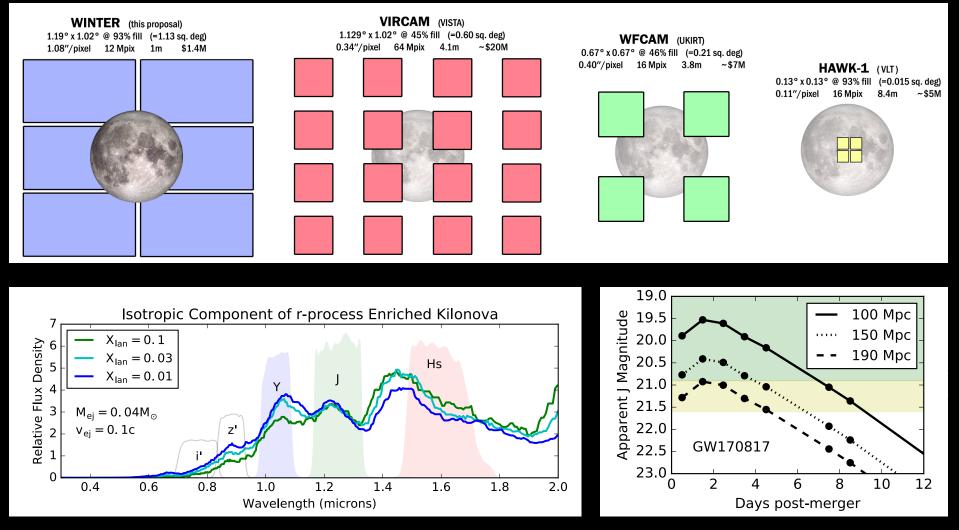
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### Supernova in the Milky Way



Adapted from Adams et al. 2013

#### WINTER @ Palomar Alternative Semiconductor Technology



In Partnership with Rob Simcoe (MIT)

Now funded by NSF MRI + Packard; First light: Summer 2020 Mansi M. Kasliwal / University of Chicago Colloquium Febr

### SPIRITS is discovering a wide range of IR transient sources.

Jacob Jencson

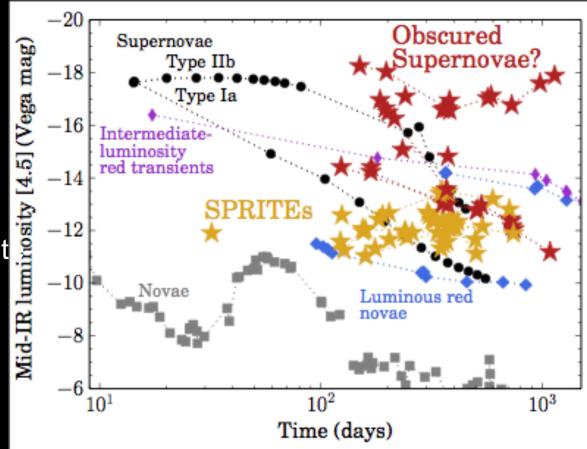
#### Identified 131+ transients

49 known supernovae

10 candidate obscured supernovae

8 likely classical novae

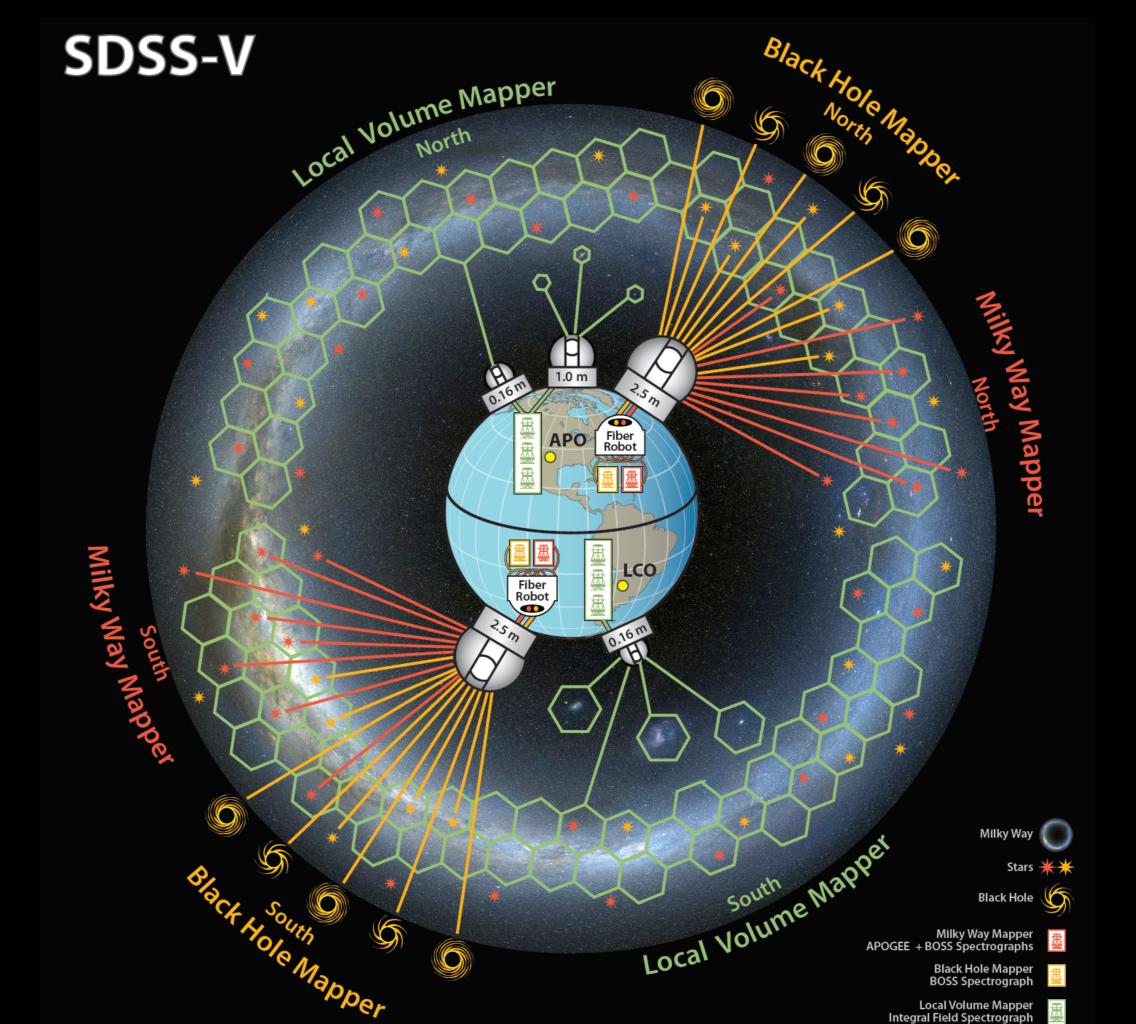
64 eSPecially Red Intermediat Luminosity Transient Events (SPRITEs)



# The Dynamic Infrared Sky is Ripe for Exploration

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### SDSS-V UPDATE



## SDSS-V's 3 "Mappers"

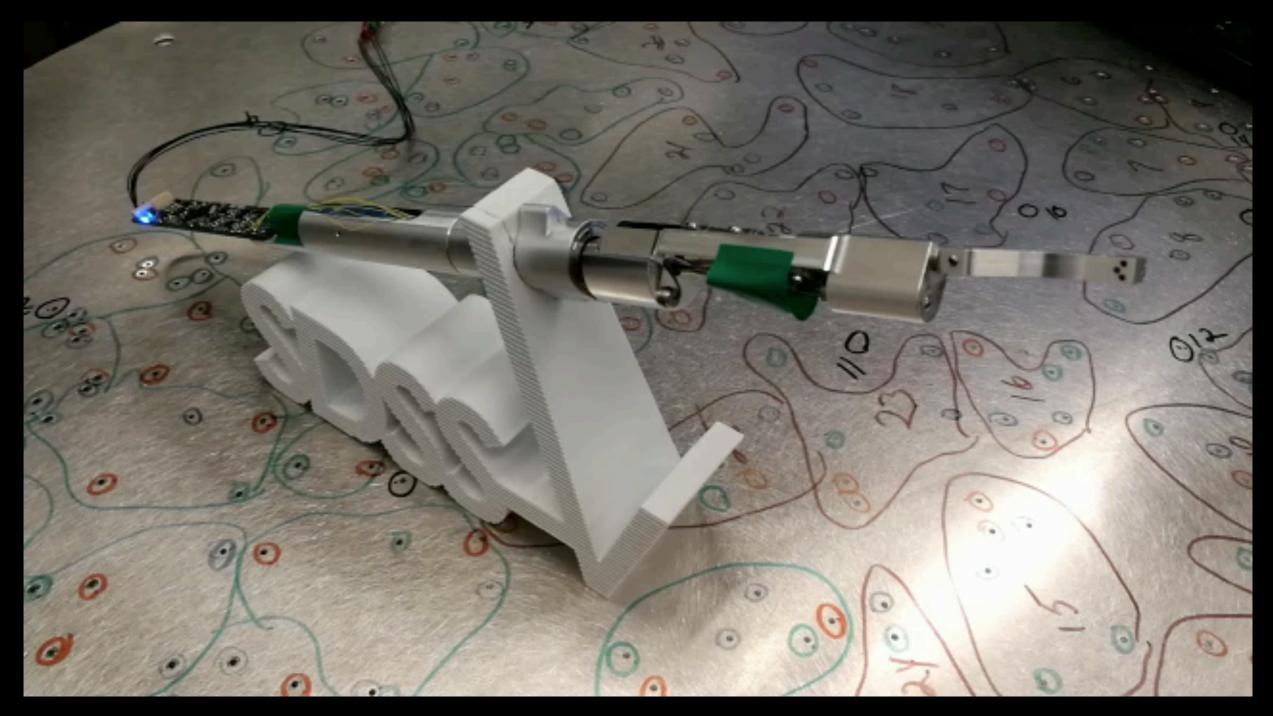
Program	Science Targets	N <sub>Objects</sub> and/or Sky Area	Primary Spectral Range and Hardware	Primary Science Goals	
Milky Way Mapper (MWM)	Stars across the Milky Way	>6M stars; all- sky	IR; APOGEE ( $R \sim 22,000$ ) with fiber-positioning system	Understanding the for- mation of the Milky Way and the physics of its stars	
Black Hole Mapper (BHM)	Primarily supermassive black holes	>400,000 sources; all-sky	Optical; e.g., BOSS ( $R \sim 2000$ ) with fiber-positioning system	Probing black hole growth and mapping the X-ray sky	
Local Volume Mapper (LVM)	ISM & stellar populations in the MW, Local Group, and nearby galaxies	>25M contigu- ous spectra over 3,000 deg <sup>2</sup>	Optical; new integral field spectrographs covering 3600-10000Å at <i>R</i> ~ 4000	Exploring galaxy for- mation and regulation by star formation; feed- back, enrichment, & ISM physics	

## Spectroscopic Surveys

Spectroscopic Survey Facilities around the Year 2020								
Survey (facility)	N <sub>target</sub>	R <sub>spec</sub>	N <sub>res</sub>	$\overline{\lambda}[\mu m]$	$\Omega_{sky}$	Nepoch	Timeframe	m <sub>primary</sub>
SDSS-V	$7 \times 10^{6}$	22,000	500	1.51-1.7	$4\pi$	4-60	2020-2024	$m_H \leq 12$
		2,000		0.37-1				$m_G \leq 18$
Gaia (RVS)	$2 \times 10^{6}$	8000	270	0.85-0.87	$4\pi$	$\sim 60$	2013-2020	$m_G \le 12$
Gaia-ESO	$0.1 \times 10^{6}$	17,000	140	0.55&	$0.02\pi$	$\sim 1$	2013-2018	$m_G \leq 17$
				0.85				
GALAH	$0.8 \times 10^{6}$	28,000	400	0.40- 0.85	π	$\sim 1$	2015-2020	$m_G \leq 13$
					$ b  \ge 10$			
WEAVE	$0.8 \times 10^{6}$	5,000&	1000	0.37-0.9	$\sim \pi$	$\sim 1-2$	2018-2023	$m_G \leq 19$
		20,000						
DESI	$8 \times 10^{6}$	3,000	5000	0.36-0.98	$\sim \pi$	$\sim 1-2$	2019-2024	$m_G \leq 19$
					$ b  \ge 25$			
LAMOST	$8 \times 10^{6}$	1,800	4000	0.4-0.9	$0.5\pi$	$\sim 1$	2010-2020	$m_G \leq 16$
4MOST	$10 \times 10^{6}$	5,000&	1600&	0.4-0.9	$1.5\pi$	1-2	2023-2028	$m_g \leq 21$
		20,000	800					$m_V \leq 16$
APOGEE-1& -2	$5 \times 10^{5}$	22,000	300	1.51-1.7	$0.5\pi$	$\sim 4$	2011-2019	$m_H \leq 12$
PFS	$1 \times 10^{6}$	3,000	2400	0.4-1.6	$0.05\pi$	1	2018-2021	$m_g \leq 22$
MOONS	$2 \times 10^{6}$	5,000&	1000	0.6-1.8	$0.05\pi$	1	2020-2025	$m_g \leq 22$
		20,000						$m_H \leq 17$

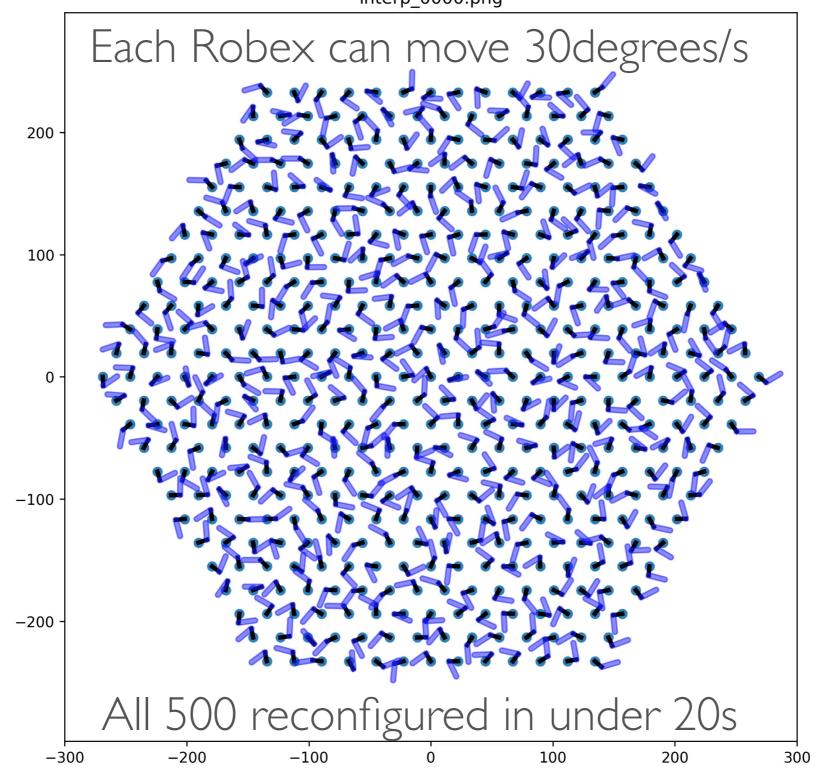
O + IR ; ALL SKY ; TIME DOMAIN!

### SDSS-V PROTOTYPEO!

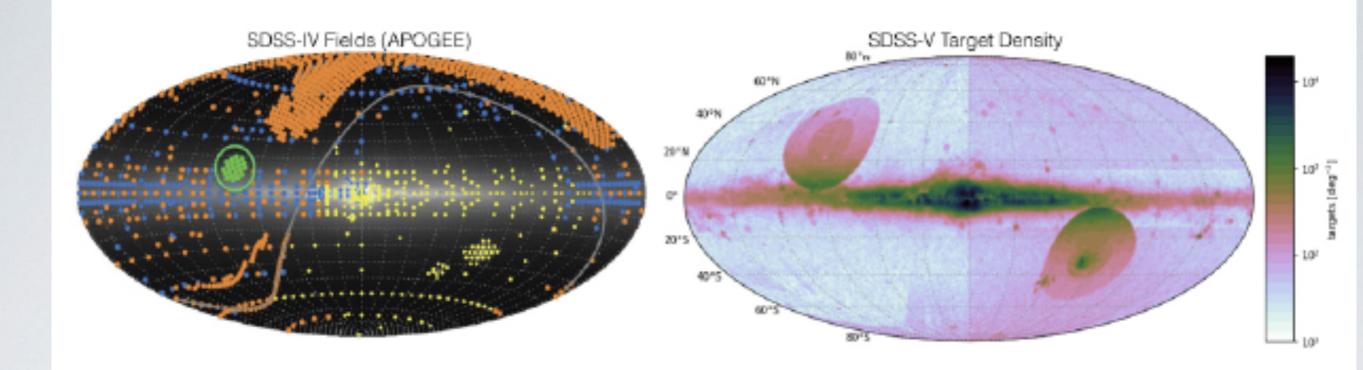


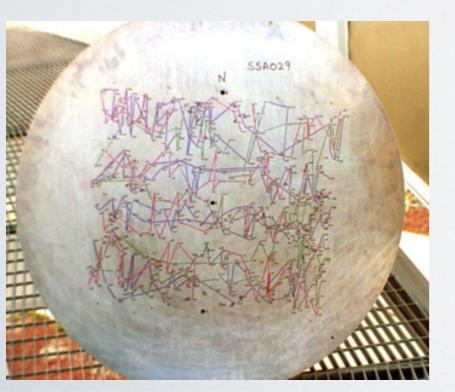
### Courtesy J-P Kneib & EPFL Team

### *Kaiju*: A Highly Efficient Collision Avoidance Algorithm for SDSS-V Robotic Fiber Positioners — Conor Sayres (U. Washington)



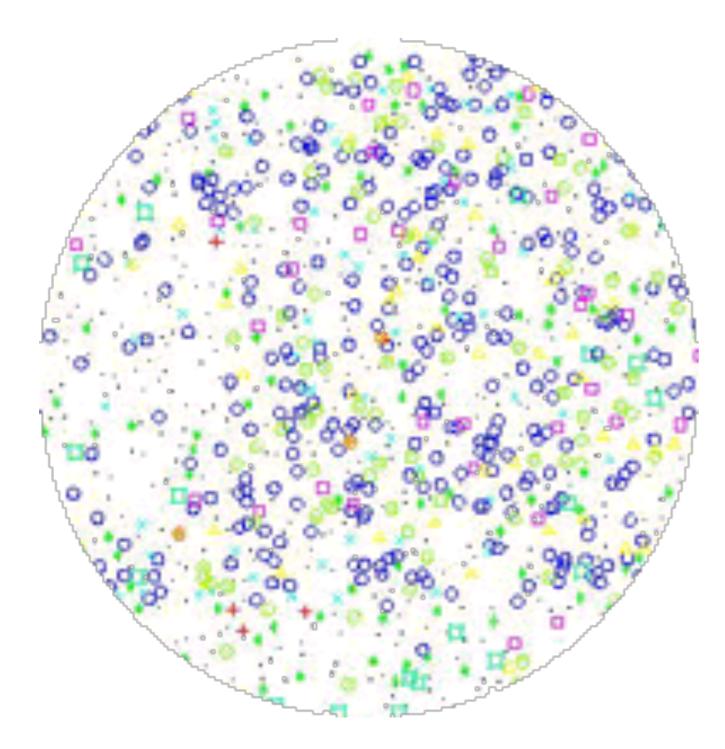
### PLATES —> ROBOTS





ALL Sky Dust-Penetrating Multi-epoch (I-60) High-quality sþectroscoþy

## ROBOTIC FIBER POSITIONERS TO FEED SPECTROGRAPHS



## SDSS-V PROTOTYPE!!

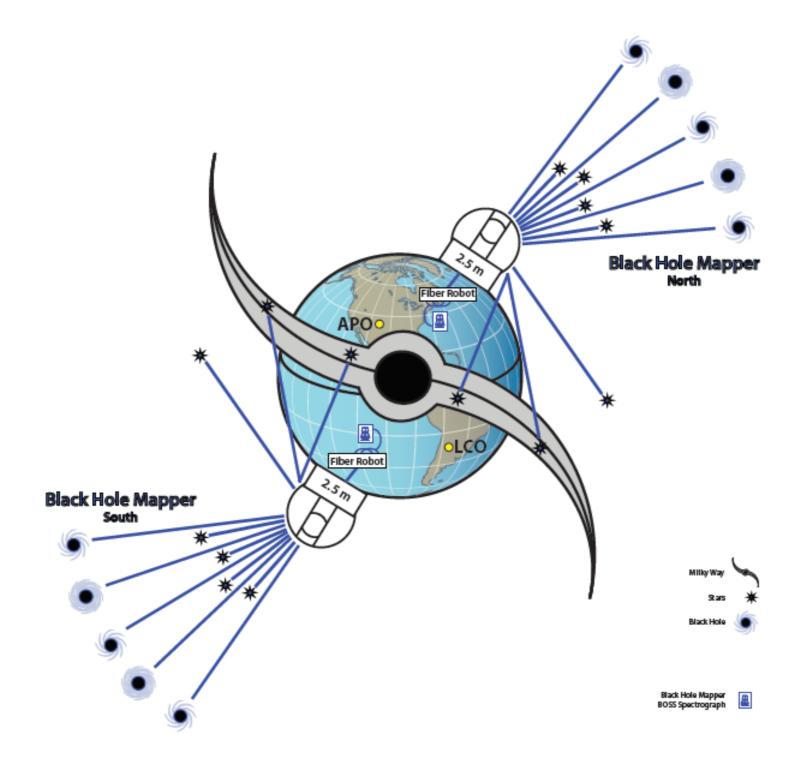
- •New prototypes tested in December/ January
- Fiber Positioning System successful PDR in November 2018
- Call of Tender for the robots has gone out (today!)



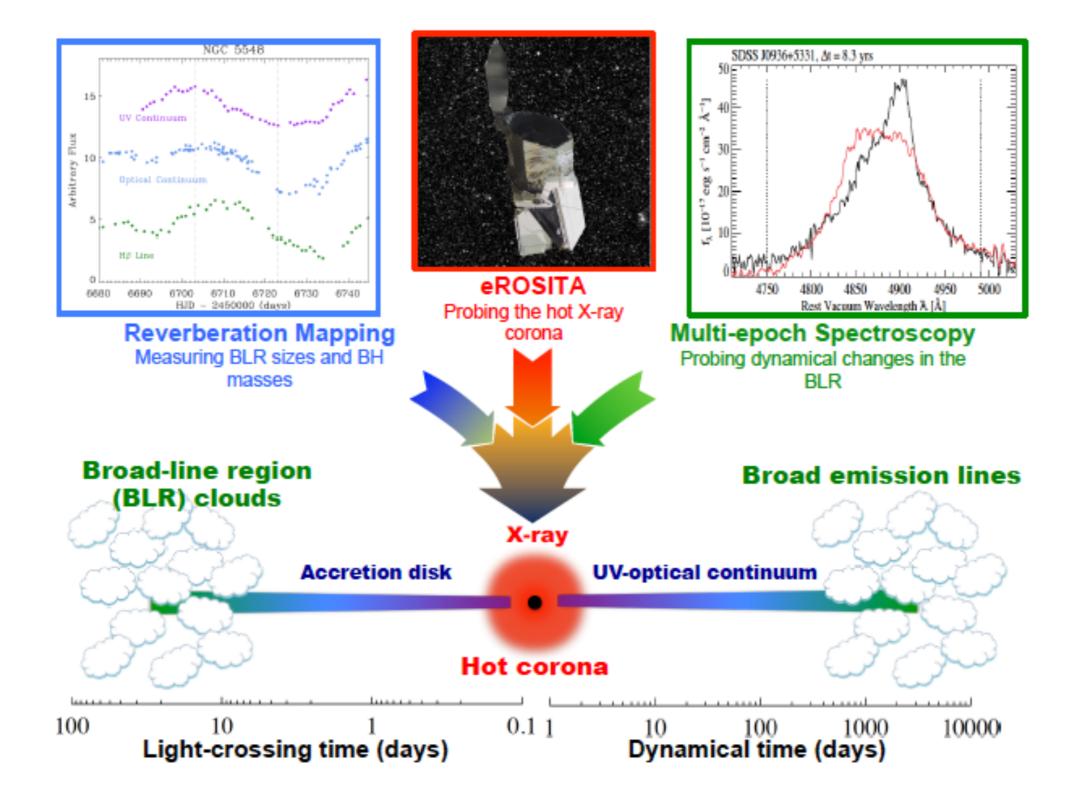
Final design review at the end of Q2!

Ready for "Robot Ridge" in mid-2020 will commission as soon as SDSS-IV completes

### **BLACK HOLE MAPPER: BHM**



### BLACK HOLE MAPPER: Understanding black hole growth

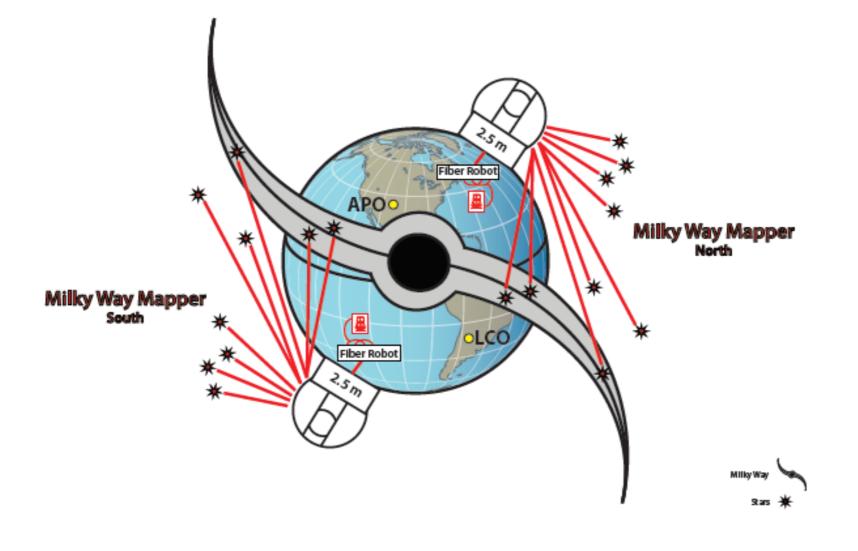


### **BHM Time-Domain Survey Outline**

Spectral time-domain astrophysics of quasars: BH masses, binarity, accretion and events, BLR dynamics, outflows, etc. Broad range of time-sampling/cadence, days to decades.

- For >20,000 quasars, 2-3 epochs during AS4 plus earlier-epoch SDSS spectra, sampling ~1-10 year timescales, e.g., transition times of changing look quasars, BAL disappearance and emergence, etc. (wide/ low-cadence tier; ~3000 deg<sup>2</sup>).
- For >2000 quasars, 12 epochs during ~2 years of AS4, probing down to ~1-month to 1-year timescales, adding unfolding BLR structural and dynamical changes (medium tier; ~300 deg<sup>2</sup>).
- Reverberation mapping (RM) for ~1000 quasars in 5 fields, >10<sup>2</sup> epochs, sampling down to days to weeks; lags between continuum and BLR emission yield BH masses; premier RM sample at high L, z. (highcadence tier; ~30 deg<sup>2</sup>)

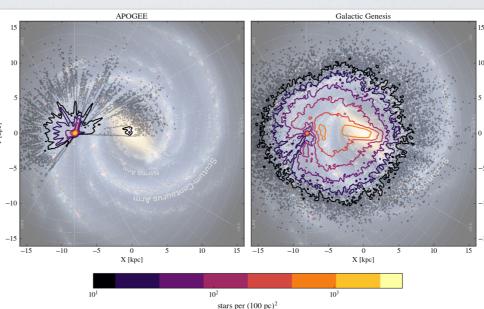
## Milky Way Mapper: MWM

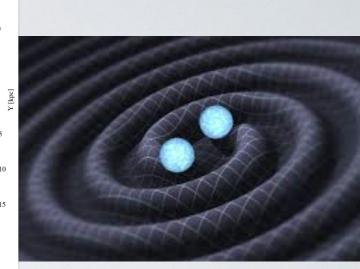


Milky Way Mapper APOGEE + BOSS Spectrographs

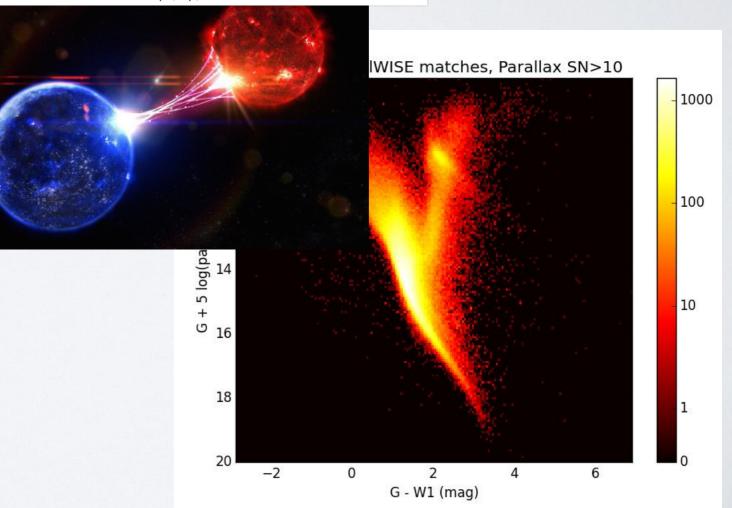
## SCIENCE GOALS (GENERAL)

- I) How did the Milky Way's disk form?
- 2) How do stars live, evolve, and die (and affect transient/GW universe)?
- 3) What stars host planets?
- 4) What IS the stellar multiplicity across the HR diagram? Role of binaries in Stellar Evolution
- 5) Origin of Supernovae and the heavy elements





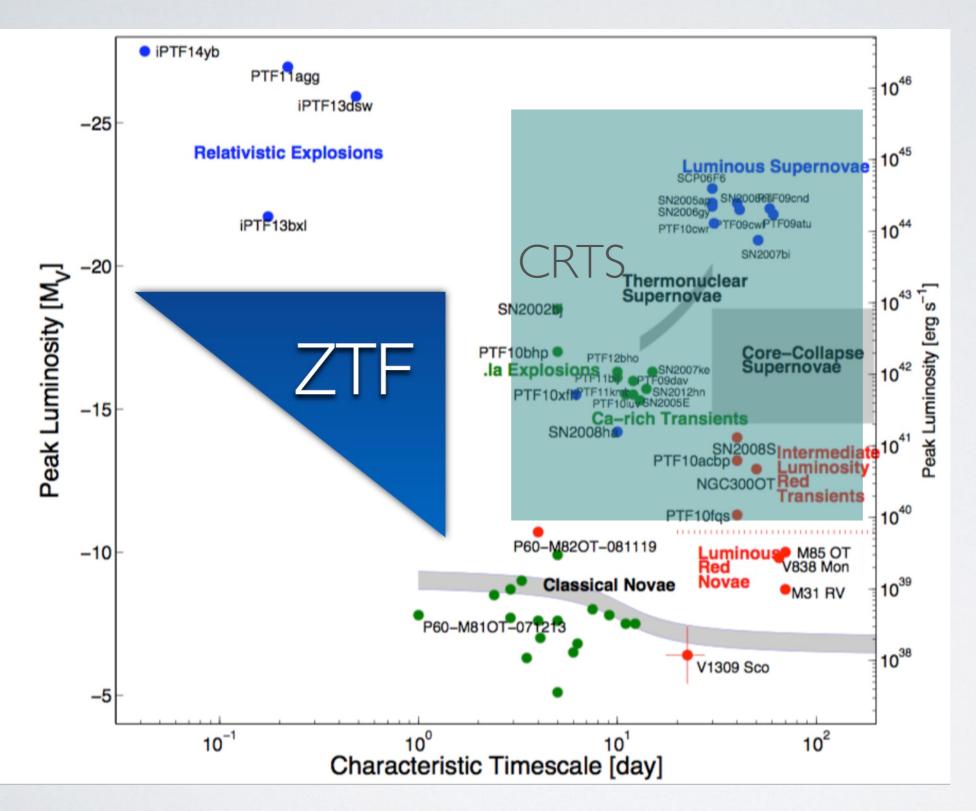
From D. Lang



Juna Kollmeier, Carnegie Observatories

	Galactic Genesis & Stellar Astrophysics Targeting Classes						
Instrument		NTargets		Comments			
Galactic Genesis Survey: mapping the dusty disk							
APOGEE	H < 11, G - H > 3.5	4,800,000	1	dust-extinguished disk			
APOGEE	z  < 200 pc, H<11, d<5 kpc	125,000	1	to complete high-res ISM map			
Binaries with	Binaries with Compact Objects: enumerating the populations of binaries with white dwarfs, neutron stars, or black holes,						
selected by variability							
BOSS	PTF, ZTF, Gaia variability	30,000	3	binaries with WDs, NSs, and BHs			
BOSS	Gaia parallaxes	30,000	1	wide WD+MS/RGB binaries			
Solar Neighb	orhood Census: observing all sta	rs within 10	0 pc, givi	ng the best probe of low-mass stars, whether in single or			
binary system	ns						
APOGEE,	d < 100 m C < 20 H < 12	400,000	2	1000× increase in volume & stars			
BOSS	d<100 pc, G < 20, H < 12	400,000	2	1000× increase in volume & stars			
White Dwarf	f Chronicle: using white dwarfs ar	nd their evol	ved comp	anions to measure the SFH and age-metallicity relation			
BOSS	G < 20	300,000	3	15× increase in sample size			
TESS Exopla	anet Host Candidates: observing a	all TESS sho	ort-cadenc	e targets in the CVZs			
APOGEE	$H \le 13.3$	300,000	1-8	all short-cadence targets & planet hosts			
Binaries Acr	oss the Galaxy: measuring enviro	nmental dep	endence (	of binary fraction in the disk, bulge, halo, and stellar			
clusters; prol	bing the brown-dwarf desert beyon	nd solar-typ	e stars				
APOGEE	$H < 13.4$ , $N_{Epoch} \ge 6$ by the	60,000	6-18	gives orbits with 24-40 epochs for all targets			
AFOULE	start of SDSS-V	00,000	0-10	with long APOGEE baselines			
Gaia Astrom	etric Binaries: characterizing rare	systems the	at have go	od astrometric orbits but limited other information,			
from Gaia's	sample of $> 10$ million stars						
APOGEE,	d < 3  kpc	200,000	1	rare types of systems			
BOSS	a < 5 kpc	200,000	1	Tale types of systems			
TESS Red Giant Variability: measuring spectroscopic properties for red giants in TESS that have seismic and/or granulation							
lightcurve sig	gnatures						
APOGEE	H < 12.5	250,000	1	stars with at least 80 days of TESS observation			
Massive, Convective Core Stars: combining dynamic and asteroseismic measurements of binary OBAF stars in the TESS CVZs							
and characterizing their multiplicity							
APOGEE	H < 12	200,000	2	detection of single vs. binary systems			
APOGEE	H < 12	500	25	>10× increase in current sample size			
Young Stellar Objects: quantifying the stellar populations in star-forming regions, including identifying sources of ionizing							
radiation and characterizing the binary frequency							
APOGEE	H < 12, d < 1  kpc	20,000	12	nearby star-formation regions			
APOGEE	H < 12	3,500	8	high-mass star-formation regions			
APOGEE	$H < 12,  b  < 2^{\circ}$	10,000	2	massive young stars in the Galactic Plane			
APOGEE	H < 13	10,000	2	Central Molecular Zone			

TRANSIENTS!

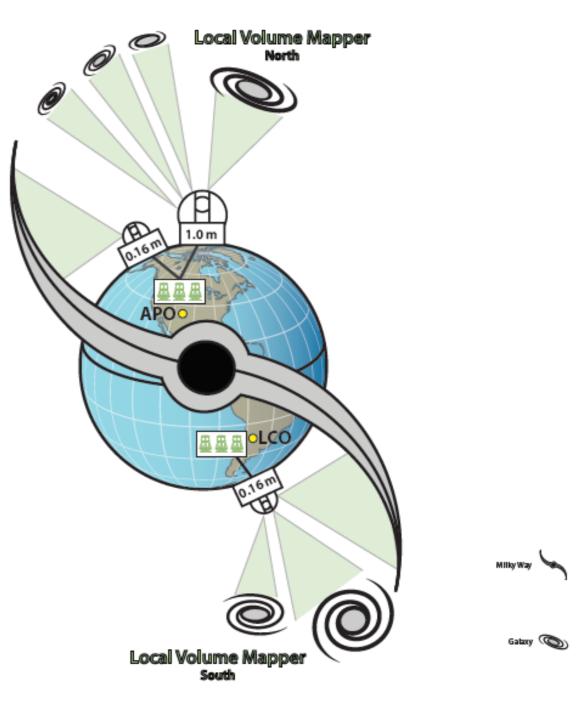


Wouldn't it be nice to settle BASIC questions like: What are Type I a SNe (and what are they NOT)?

B. Penpraese

## Local Volume Mapper: LVM

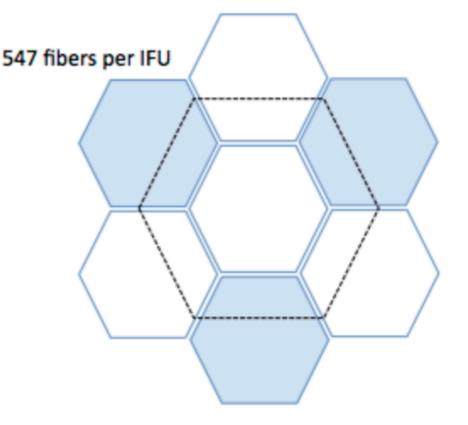
- Using different telescope sizes of and an array of IFU-coupled spectrographs at *R*~4000 and 3600-10000Å, we survey
- 2800 sq. deg. in the MW @ 0.1-1 pc resolution,
- 300 sq. deg. in the MW 10x deeper,
- LMC & SMC @ 10 pc resolution,
- M31 & M33 @ 20 pc resolution, and
- 12 nearby galaxies (D≤5 Mpc) @ 50 pc resolution

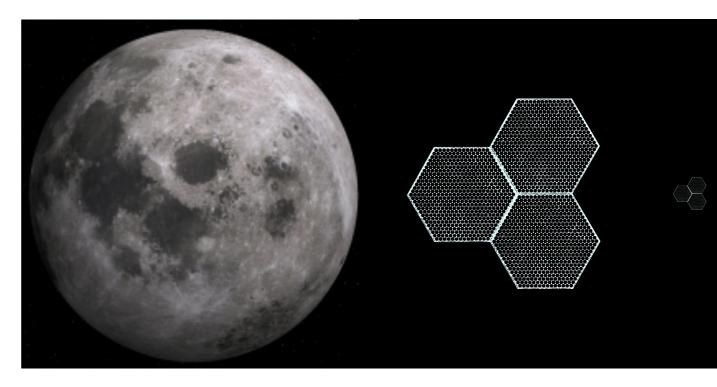


### LVM hardware

#### IFU design

- ✤ 3 x 547 hexagonal non-abutted lenslet coupled IFUs arrays.
- ✤ 309 calibration fibres.
- Based on highly-successful MaNGA design.
- \* 490 arcmin2 @ 0.16 m
- ★ 12 arcmin2 @ 1 m





### **OBSERVING GALAXIES AT THE "ENERGY INJECTION SCALE"**

LVM MW Wide Survey: 2800 deg<sup>2</sup>

LVM MW Deep Survey: 300 deg<sup>2</sup>

### Cosmological Zoom-In Observations!

Juna Kollmeier, Carnegie Observatories





## Orion

- M42 0.07 pc / spaxel
- APOGEE stars (yellow)
- Combine information from gas and stars to map the interaction between stars and ISM
- Have Teff, L, Z, [X/H], f<sub>uv</sub>, (age) for each star
- Gas: temperature, density, kinematics, abundances



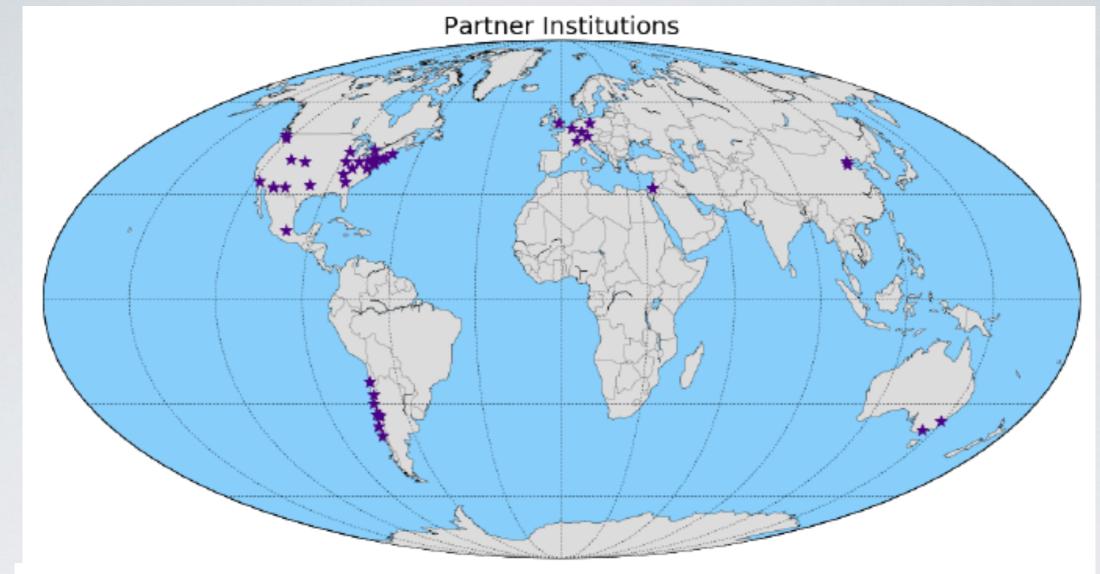
# INSTITUTIONAL PARTNERSHIP

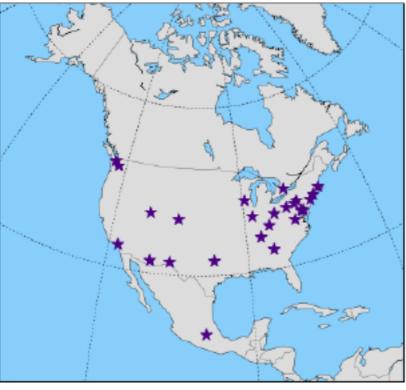
# GROWTH OF COLLABORATION

Growth of Collaboration (2017/2018)



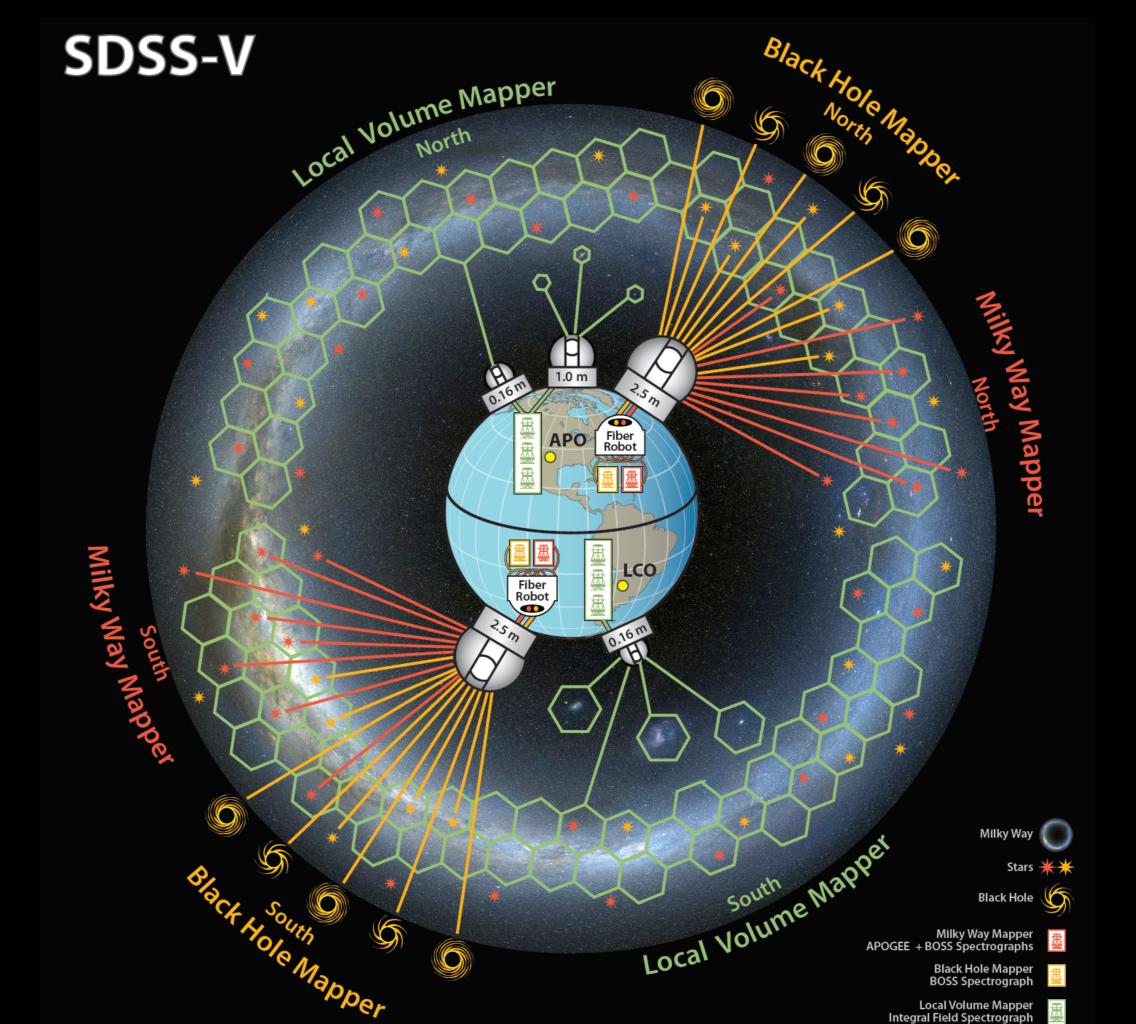
SDSS Collaboration Matrix	MOU Signed/Out for Signature	MOU in Draft/Iteration	Prospective Institutions
FULL MEMBERS	CU Boulder Harvard MPE MPIA NMSU OSU NAOC Yale CNTAC	Carnegie Wisconsin STSCI UofA JHU UNAM U of Toronto SAO	NOAOINAF
3 Slot Members	AIP PSU Flatiron UIUC	UVA	Caltech MIT
Individual (1/2) slot Members	University of Washington (2) TCU, TAU (2) Vanderbilt, KIAA, U. Warwick, NYU, KU Leuven, Columbia, U. Penn,York University, University of Victoria, U. Pittsburgh, Georgia State	Monash University EPFL ANU	Oxford St. Andrews Nanjing U. SHAO



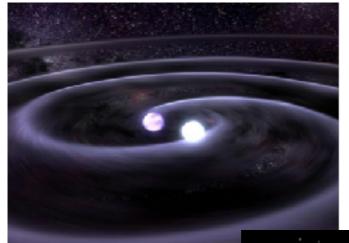


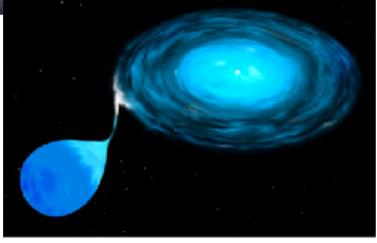


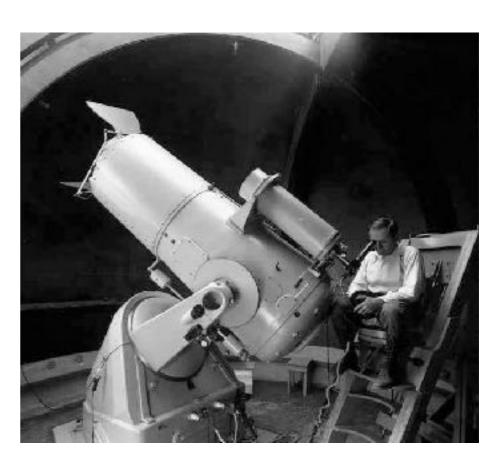
			DSS-V			7
ARC Board of Gobernors		Technical Advisory Group				
Chair: Mike Crenshaw (GSU)		Central Project Office				Chair: Douglas Finkbeiner (Harvard)
	Director: Juna Kollmeier (OCIS)					Davis Hogg (NYU) Jim Gunn (Princeton)
	5	Project Scientist: Hans-Walter Rix (MPIA)				
Advisory Council	s	Spokeperson: Gail Zas	owski (UU)			David Weinberg (OSU) Connie Rockosi (UCSC)
Chair: Keivan Stassun (Vand, SAPG)	1	Project Manager: Solan	ige Ramirez (OC	CIS)		Mike Blanton (NYU)
Ani Seth (UU)		ead Systems Enginee	Systems Engineer: Stefanie Wachter (OCIS)			David Schlegel (LBL)
Charlie Conroy (Harvard)				(/	1	Matt Johns (MJI)
Eva Schinerer (MPIA)						
Sujian Wu (NAOC)	Instrument Developm	ent				
Jon Holtzman (NMSU)						
Meg Urry (Yale)	Focal Plane System Local Vo	lume Mapper		Obse	ervatory Operations	
David Weinberg (OSU)	P. Pogge, C. Brandon, T. N. Konida				Observatory: J. Crane, D. Osip	
Julie Comerfeld (CU)	O'Brien (OSU) Froning (U	(דו		(OCIS)		
Mike Erakleous (PSU)					Observatory: M. Klaene, J.	
Mathias Steinmetz (AIP)				Downney (APC	0)	
Mike Blanton (NYU, GPG)	Data Processing Tea	m	Ops. Software: J. Sanchez-Gallego, C. Sayres			
Tony Wong (UIUC)	Principal Data Sci.: J. Brownsteing (	(UW)		(UW)		
John Mulchaey (OCIS)	Finicipal Data Sci. 9. Diownstering (	(00)				
Xiaoui Fan (UofA)	CAS: A. Thakar (JHU)					
Christy Tremonti (Wisc)						
		Sum	ey Execution			
	Milky Way Mapper (MWM)	) Black Hole Mapper (BHM)		M) Loo	cal Volume Mapper (LVM)	
	Prog. Lead: Jennifer Johnson (OSU)	SU) Prog. Lead: Scott Anderson (UW)		Prog. L	ead: Niv Drory (UT)	
	GG Survey Scientists: M. Ness (MPI & J. Bird (Vand)	PIA) Survey Scientists: A. Merloni (MPE) & Y. Shen (UIUC)			Scientists: K. Kreckel (MPIA), G. OCIS), E. Pelegrini (UH)	
	SA & SSA Survey Scientists: N. De Lee (NKU) & A. Tkacheno (Leuven)					
	Scientific Working Groups					
	White Dwarfs: B. Gaensicke XRB/Compact Binaries: A. Schwope Machine Learning: B. Bovy, A. Casey					
	Stellar Models: C. Conroy	Reverberation Mapping: K. Horne LVM Mil		lky Way:TBD		
	Dust Mapping: E. Schlafly			LVM IS	M: M. Seibert	
	TESS/Planet Host: J. Teske			LVM St	ellar Populations: K. McQuinn	
	TESS/PLATO: S. Hekker Machine Learning: B. Bovy, A. Casey		sey LVM Co	old Gas: E. Schinnerer		
	TESS/Astero: J. van Saders					
	L					



#### **Exotic variables from ZTF**







#### **Thomas Kupfer**

Kavli Institute for Theoretical Physics University of California, Santa Barbara















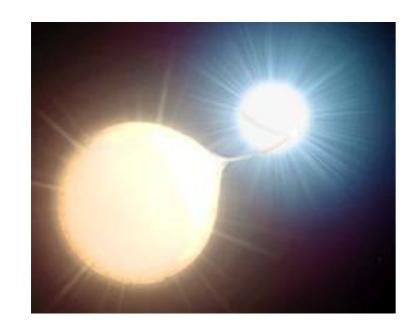
WICKY TRANSIENT FACILITY

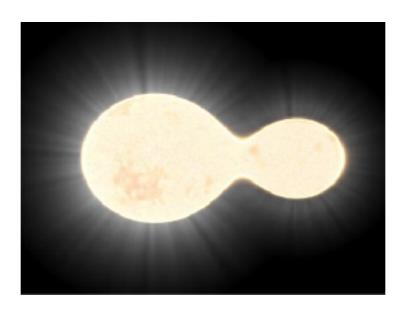




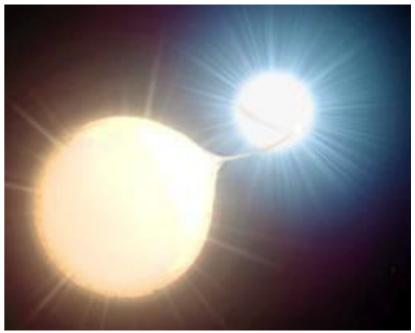


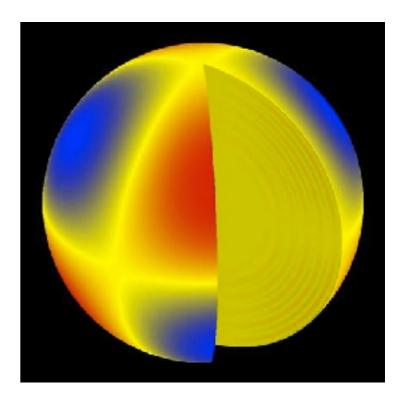
#### Stellar variability is very common



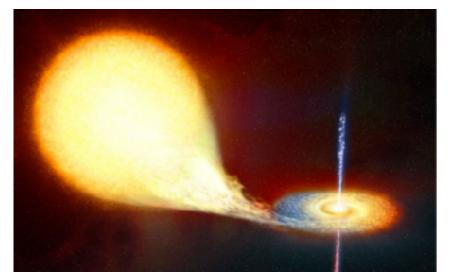












#### How did we find them



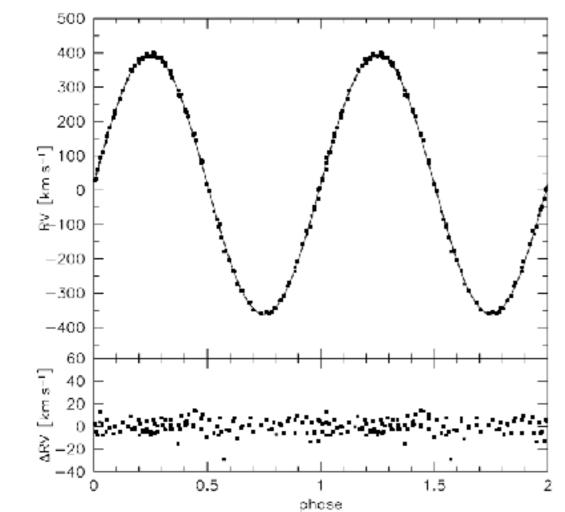


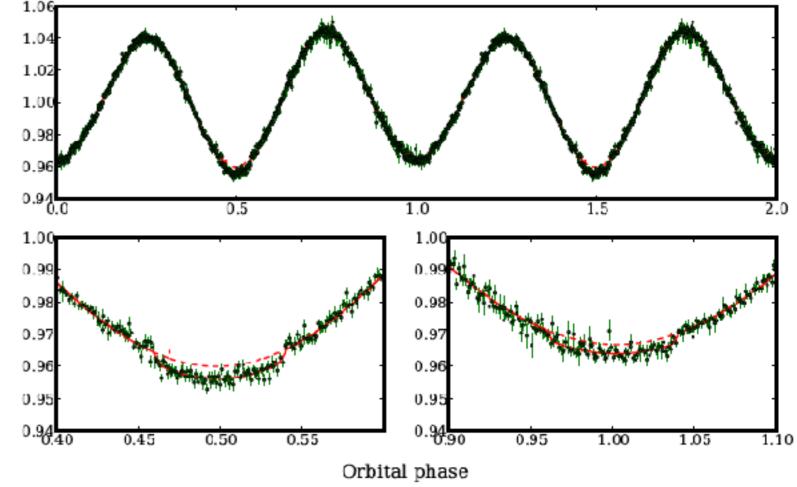
#### CD-30 11223 - SN la progenitor candidate (P<sub>orb</sub> = 70min) - <u>found completely serendipitously</u>

Flux

- Lightcurve shows weak eclipses
- Analysis gives:

M<sub>sdB</sub> = 0.54 M<sub>sol</sub>; M<sub>WD</sub> = 0.74 M<sub>sol</sub> => Progenitor system most likely 3 + 4 M<sub>sol</sub> binary



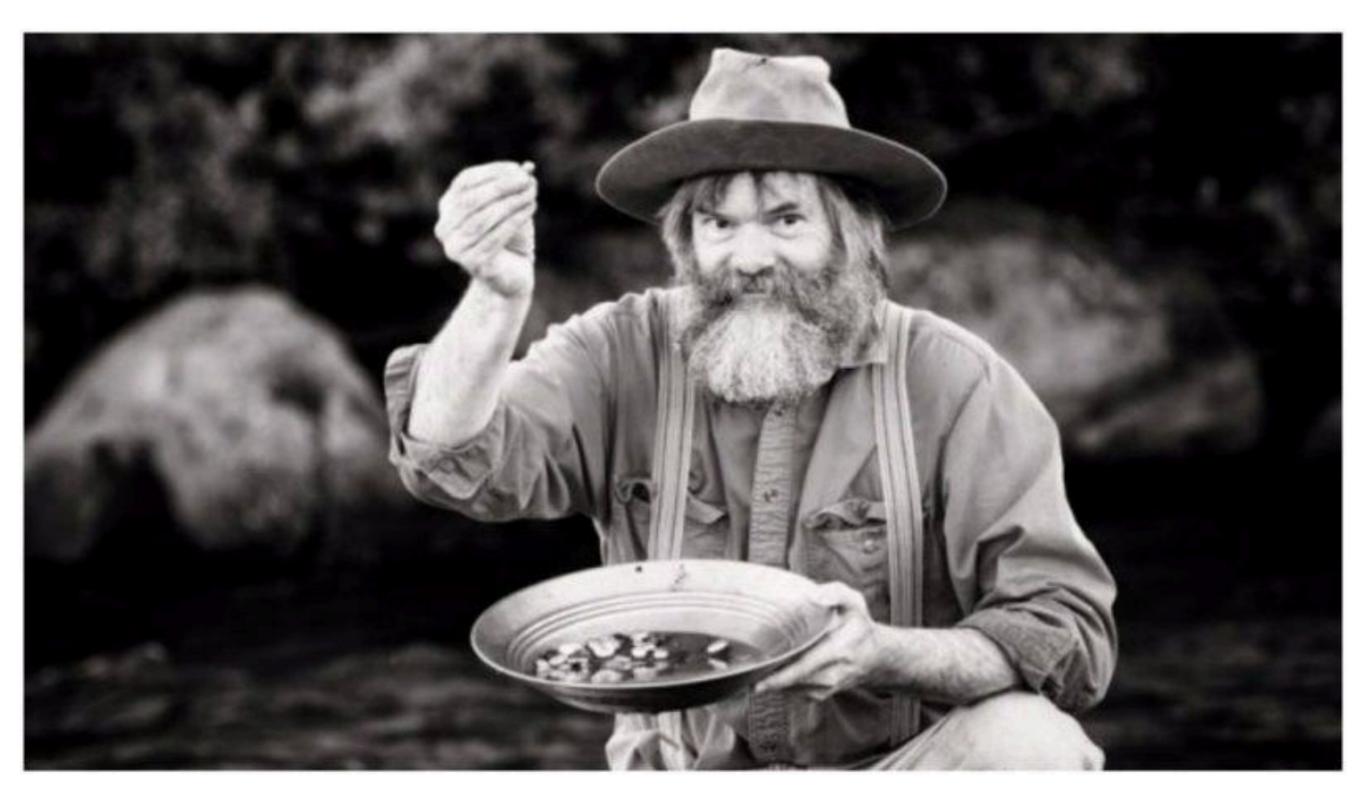


Will get in contact in about 40 Myr

Will probably explode as SN Ia??

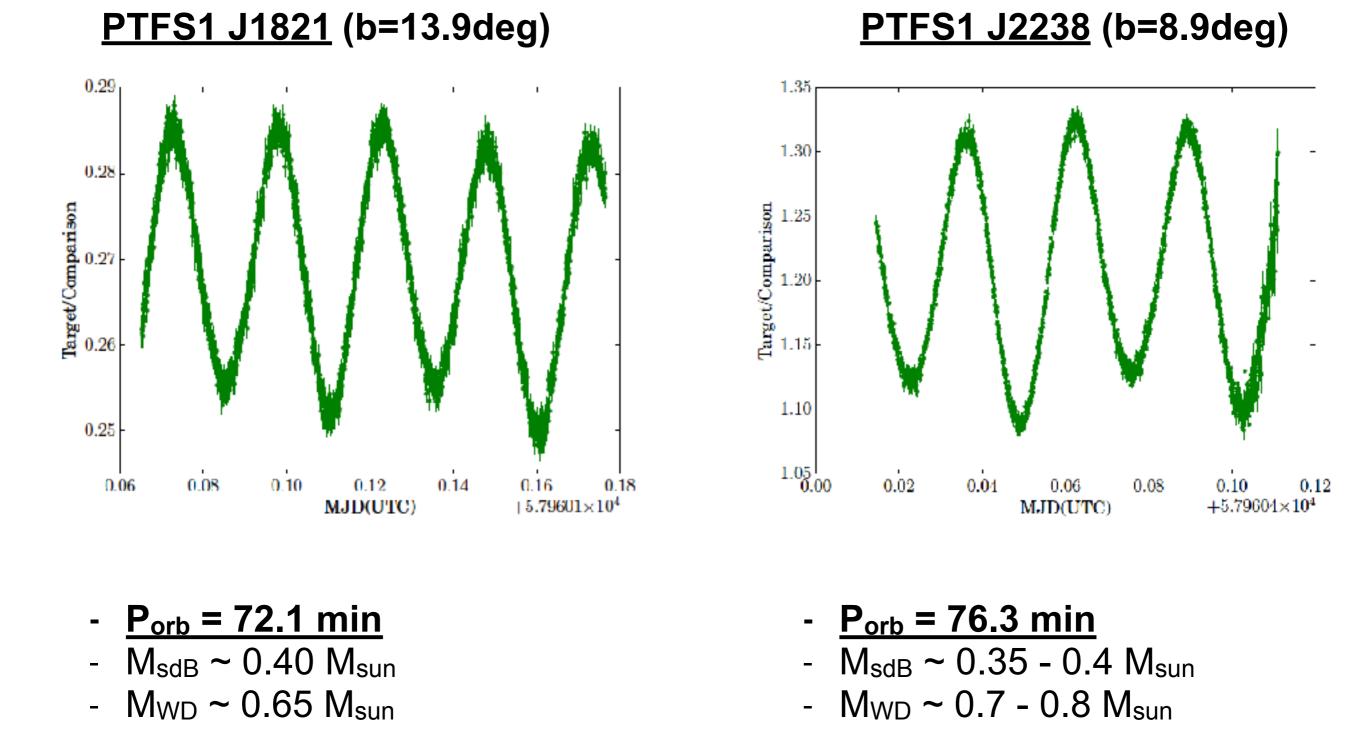


#### Look for the freaks



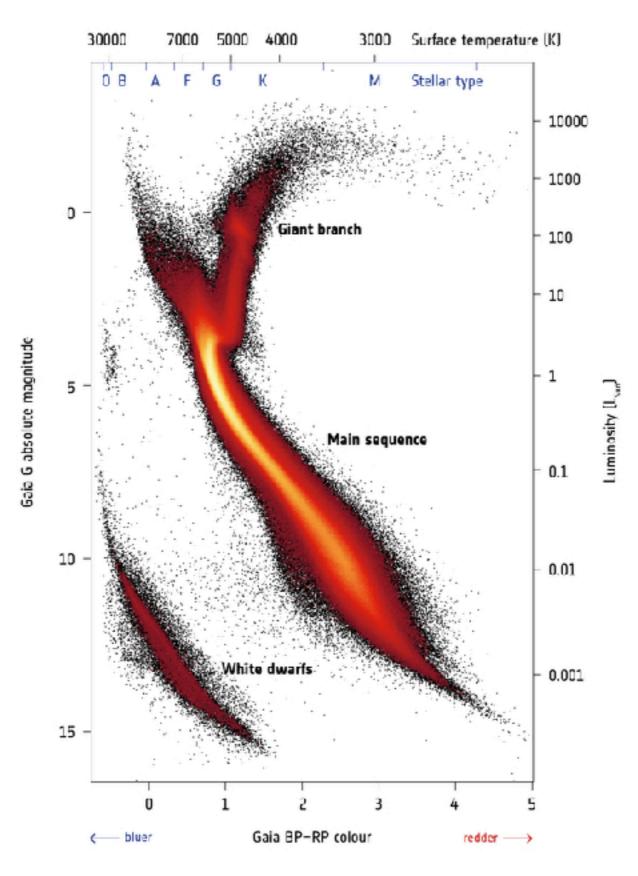


#### Two new CD-30 like systems from PTF -Parameter (very preliminary)





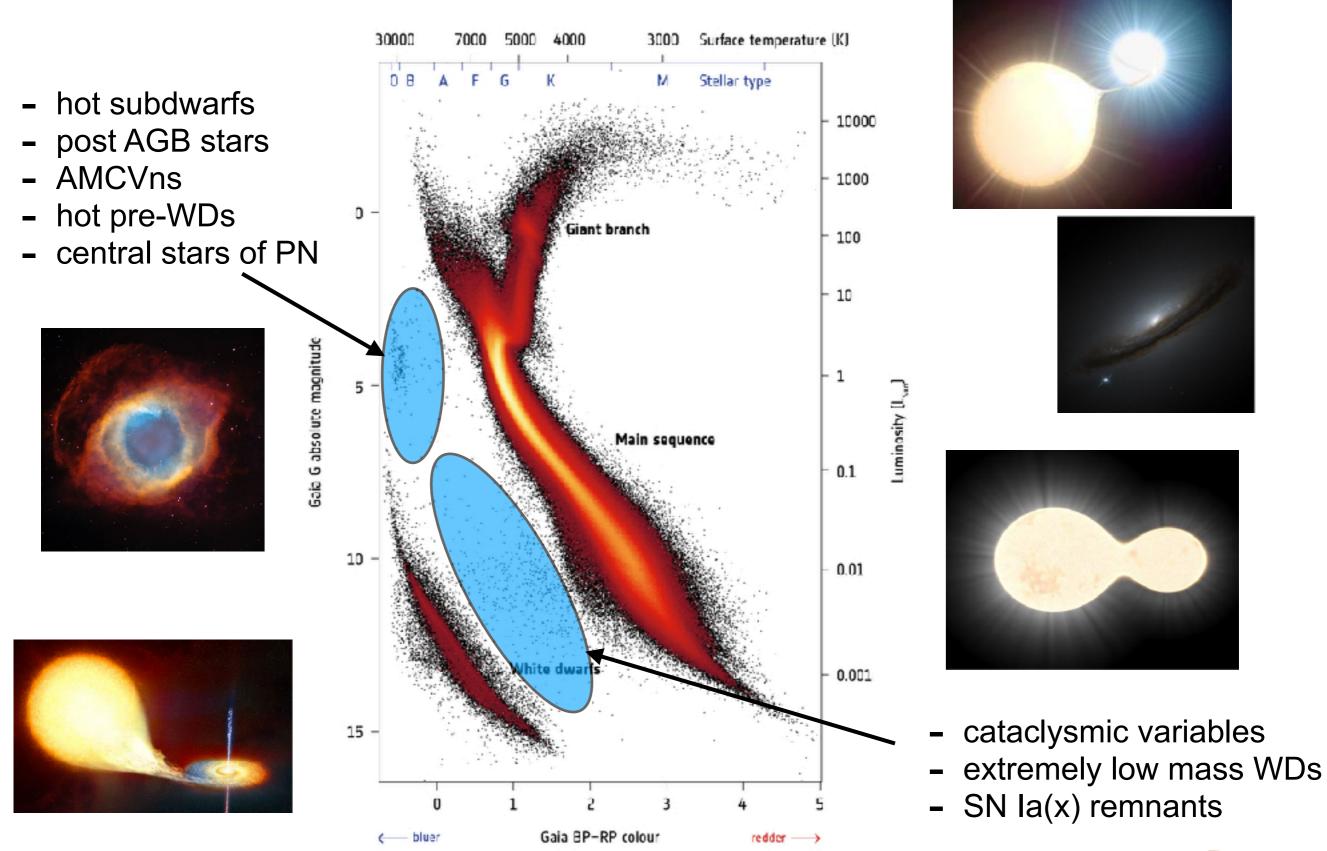
#### Look for the freaks





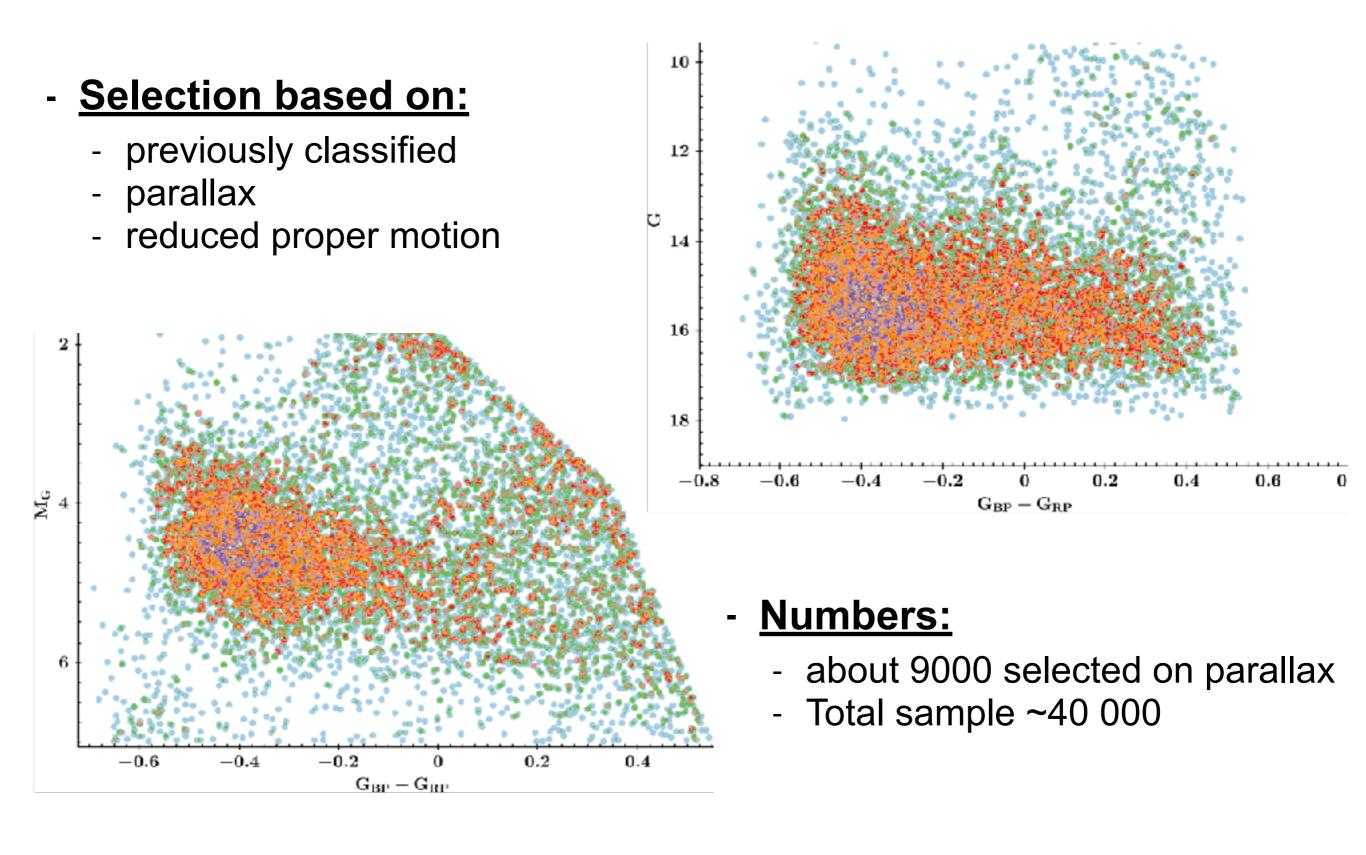


#### The population of freaks



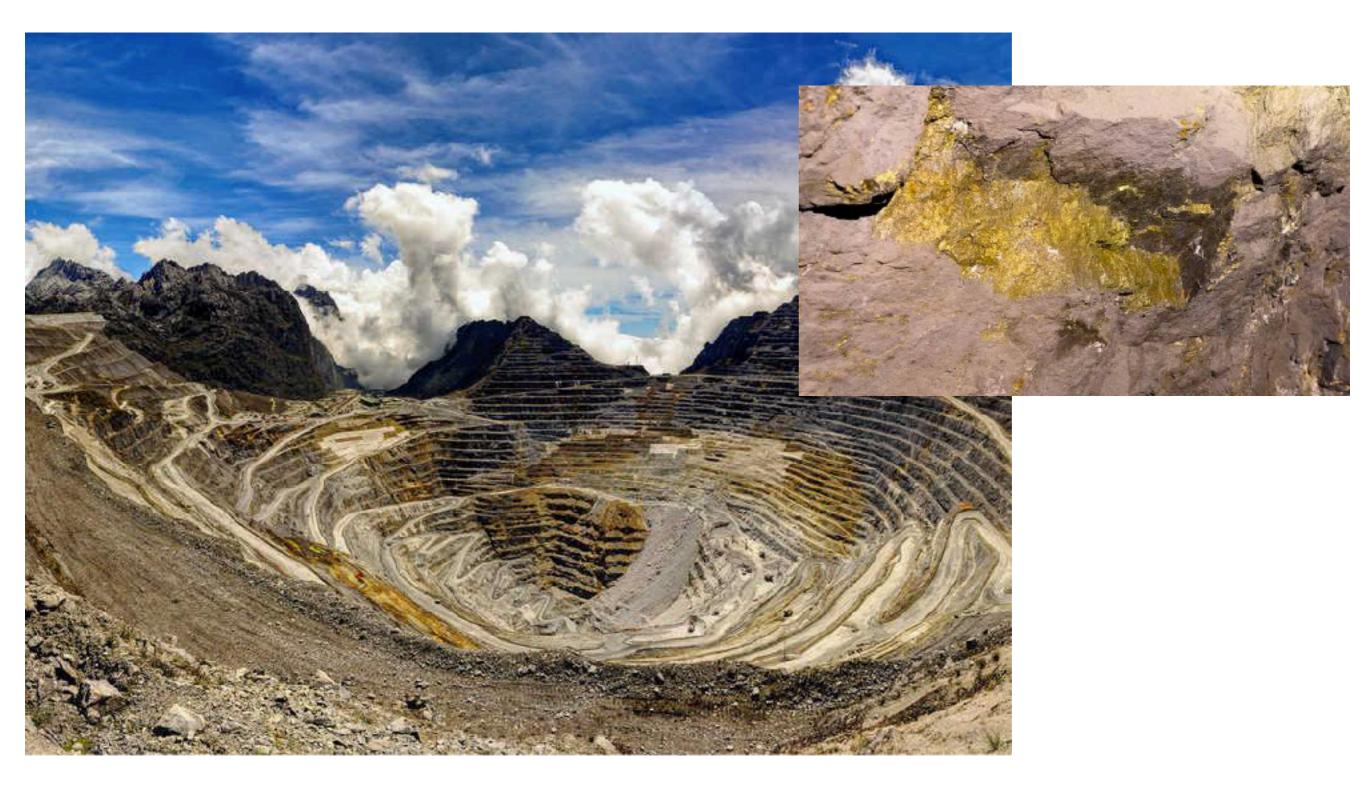


#### The sample of hot subdwarf stars



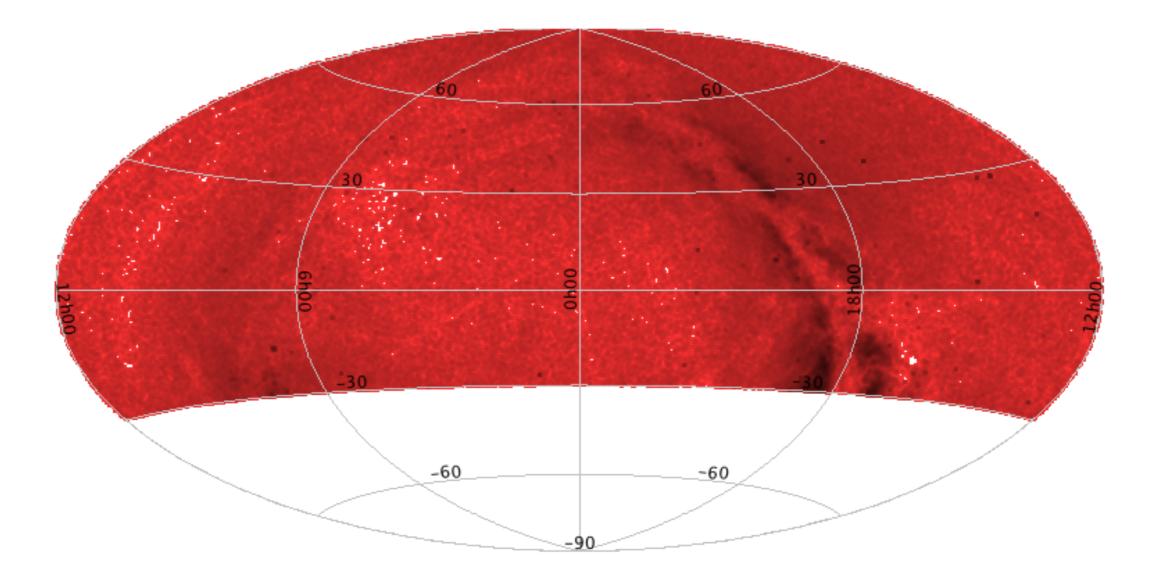


#### Data minining





#### The ZTF high-cadence Galactic Plane survey

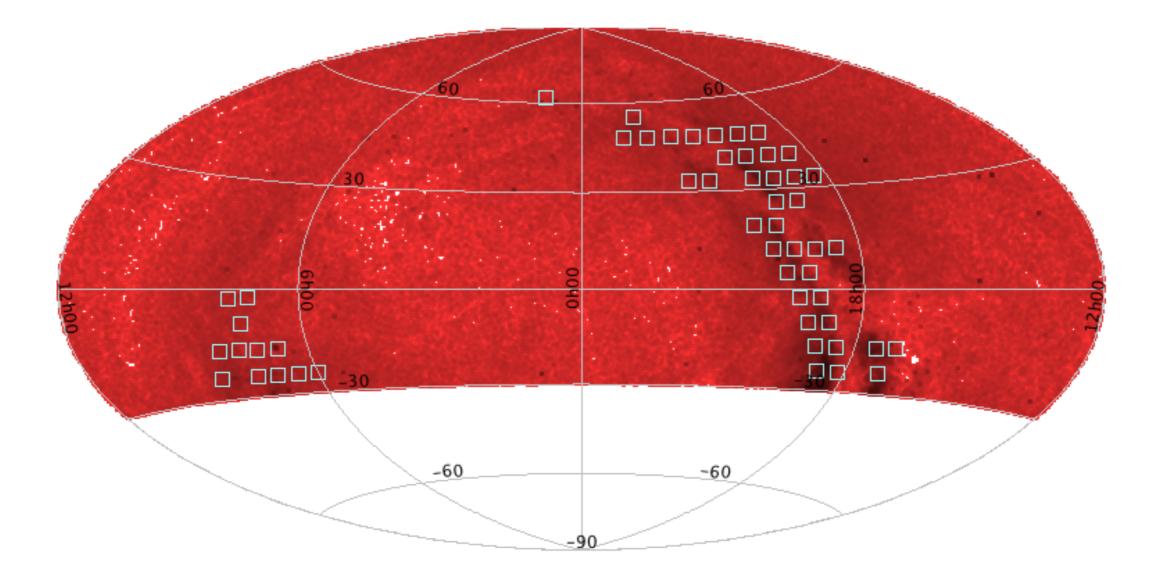


## The fast and the furious - A fast cadence survey of the Galactic Plane

- <u>Time period:</u> mid 2018 mid 2019
- <u>Cadence</u>: continuous for 2 3 hrs
- <u>Coverage</u>: ~2500 square degrees



#### The ZTF high-cadence Galactic Plane survey



## The fast and the furious - A fast cadence survey of the Galactic Plane

- <u>Time period:</u> mid 2018 mid 2019
- <u>Cadence</u>: continuous for 2 3 hrs
- <u>Coverage</u>: ~2500 square degrees



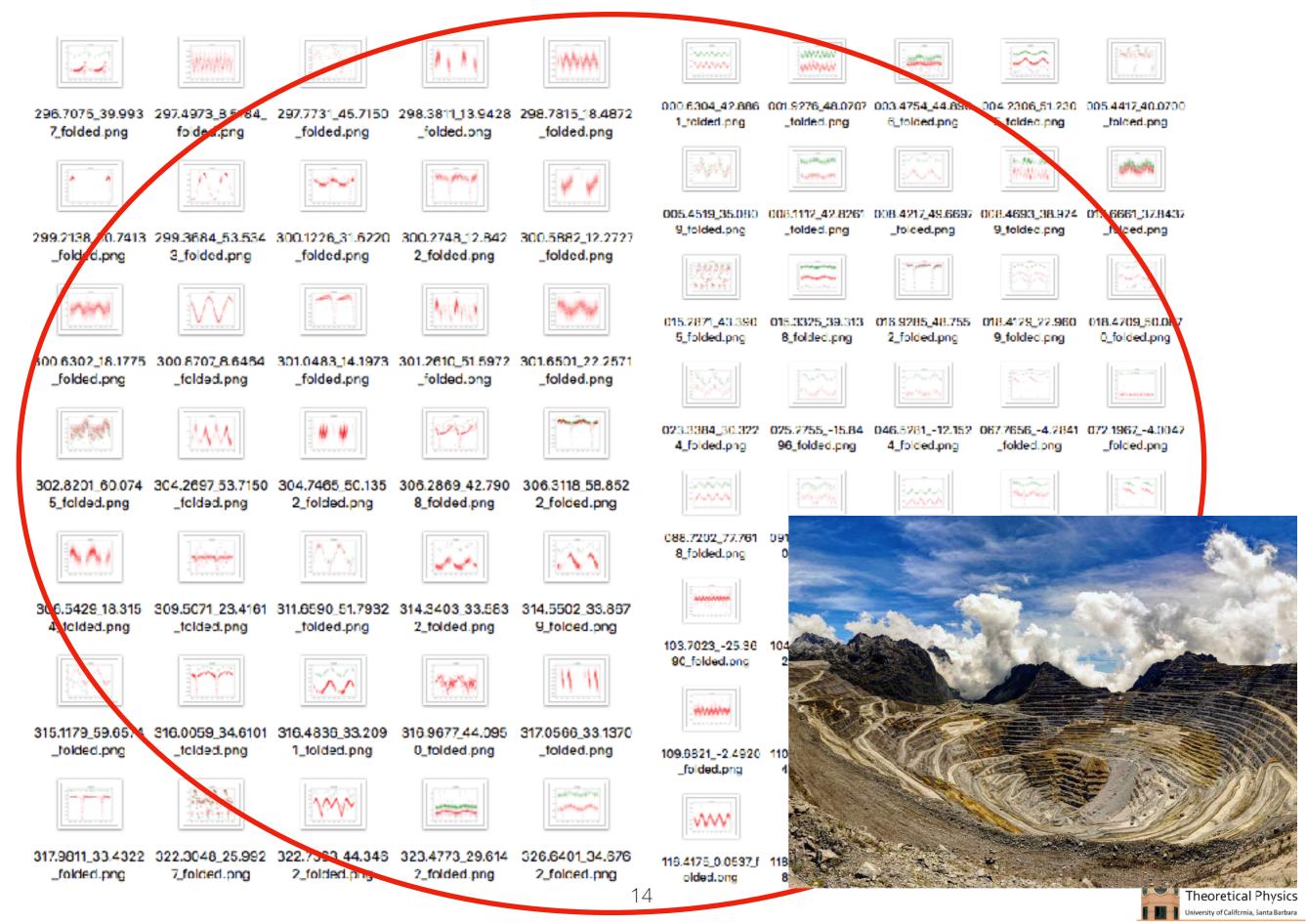
#### **Include time-domain information**

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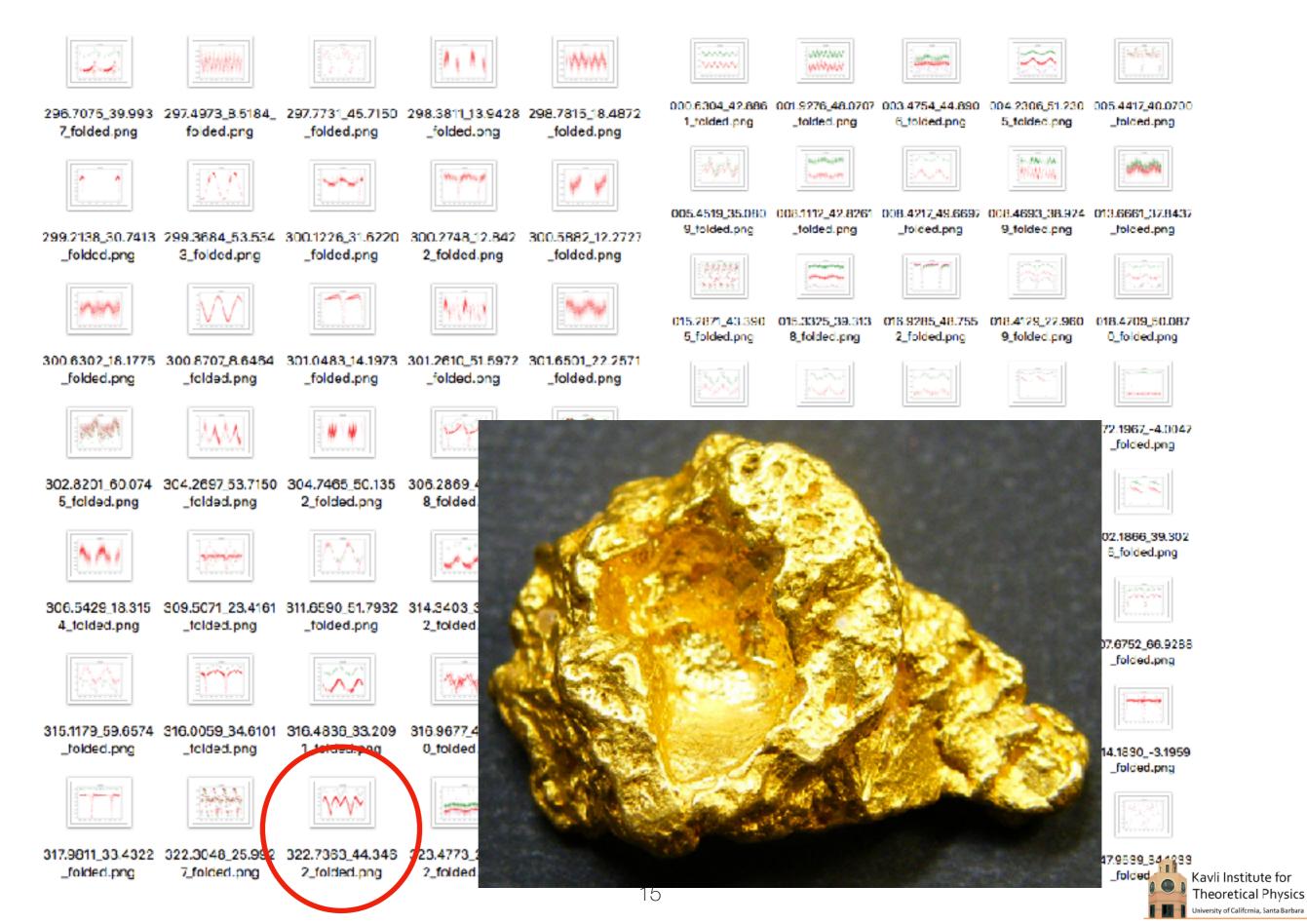


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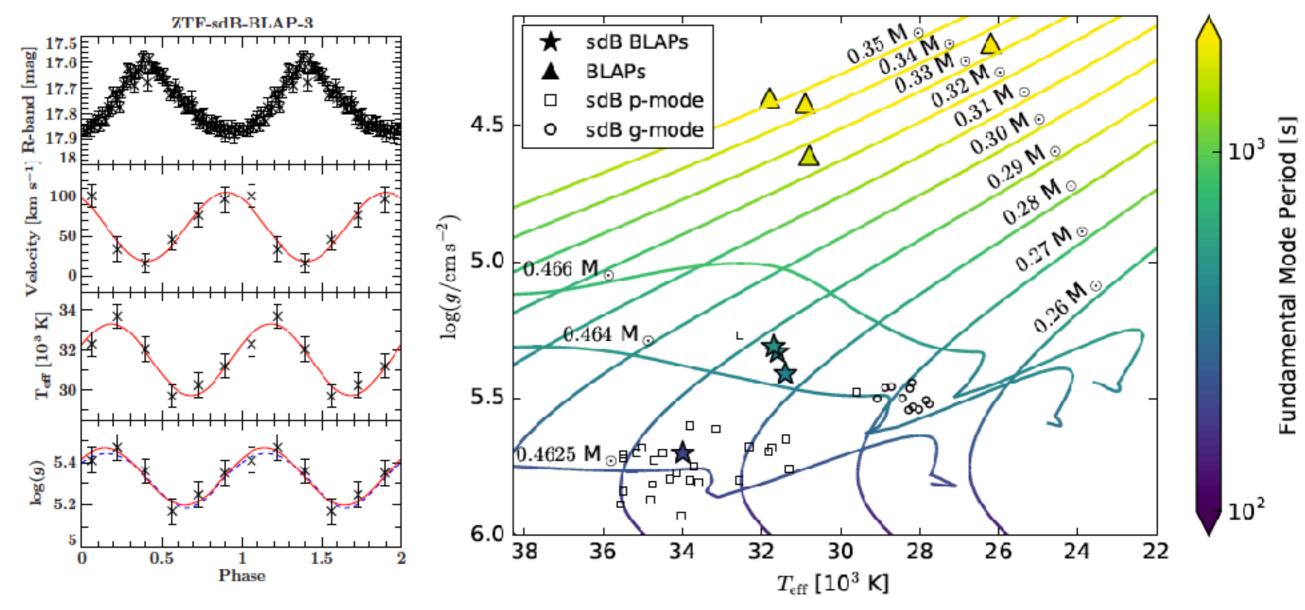
#### **Include time-domain information**



#### **Include time-domain information**



#### A new class of radial mode hot subdwarf pulsators



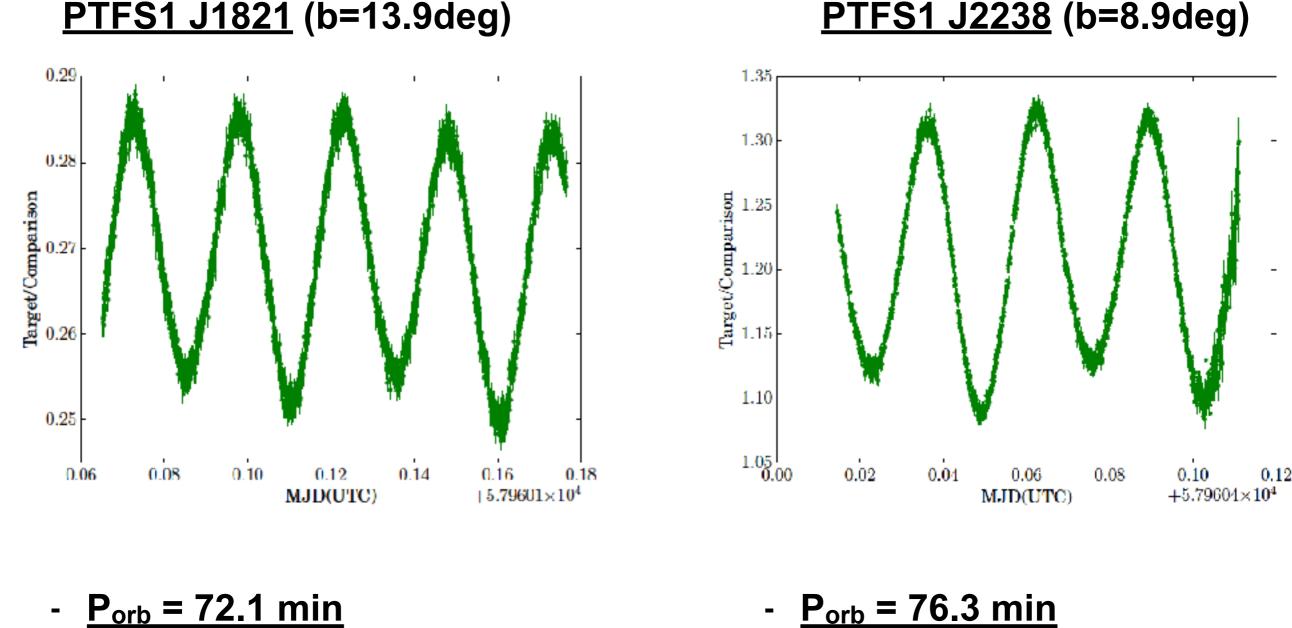
- Large amplitudes (photometry, velocity, Teff, surface gravity)
- 4 candidates, periods 3-8 min
- Observed mass and period is best consistent with cooling low mass helium white dwarf models with mass around 0.25 - 0.30 M<sub>sun</sub>
- Low mass He-core burning stars cannot be fully excluded

**Thomas Kupfer** 

Kupfer et al. in prep.



#### Two new CD-30 like systems - Parameter (very preliminary)



- $M_{sdB} \sim 0.40 M_{sun}$
- $M_{WD} \sim 0.65 M_{sun}$

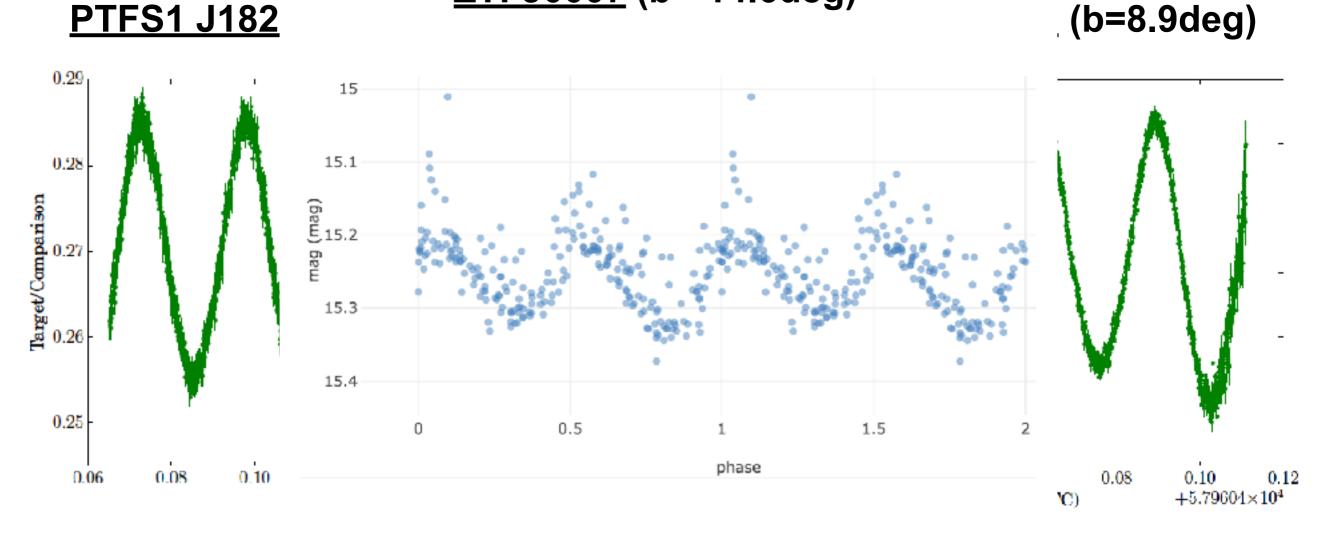
- <u>P<sub>orb</sub> = 76.3 min</u>
- M<sub>sdB</sub> ~ 0.35 0.4 M<sub>sun</sub>
- MwD ~ 0.7 0.8 Msun



## Two new CD-30 like systems - Parameter (very preliminary)

**ZTFJ0007** (b=-14.6deg)

(b=8.9deg)



- <u>Porb</u> = 72.1  $M_{sdB} \sim 0.40$ 

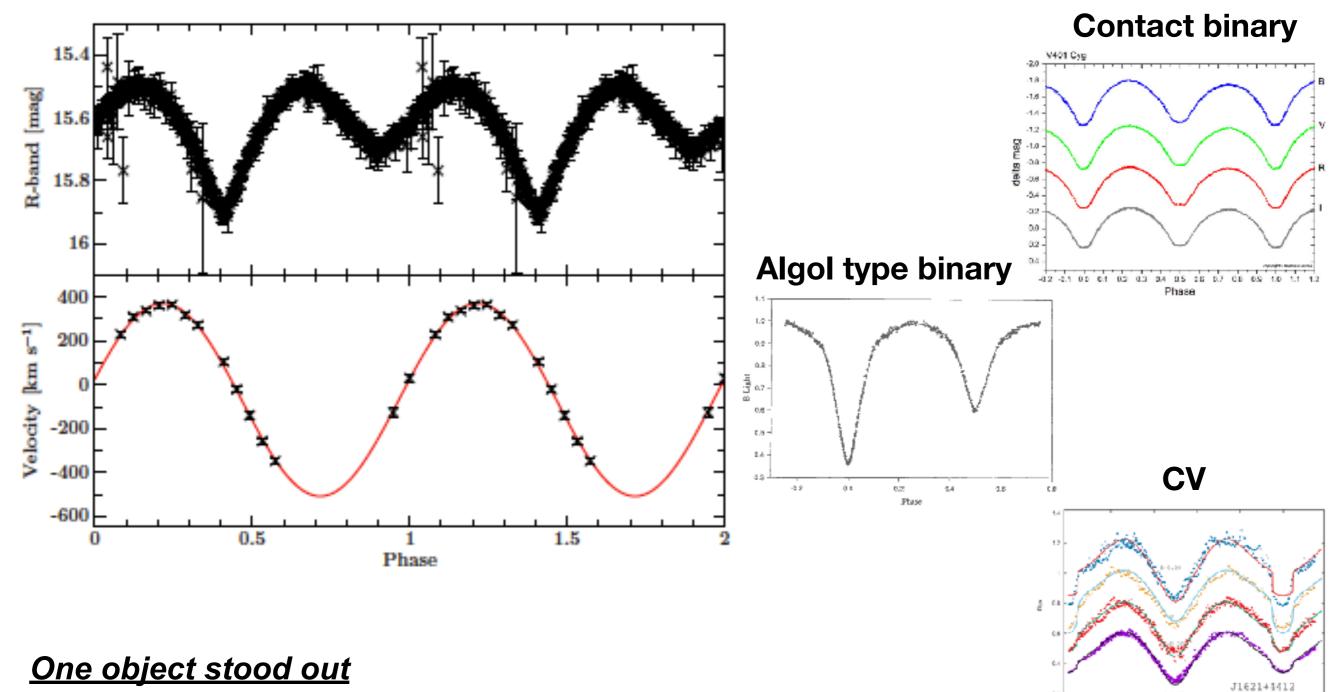
- <u>Porb = 108 min</u>
- typical sdB but no full RV curve yet

4 M<sub>sun</sub> M<sub>sun</sub>



 $M_{WD} \sim 0.65$ 

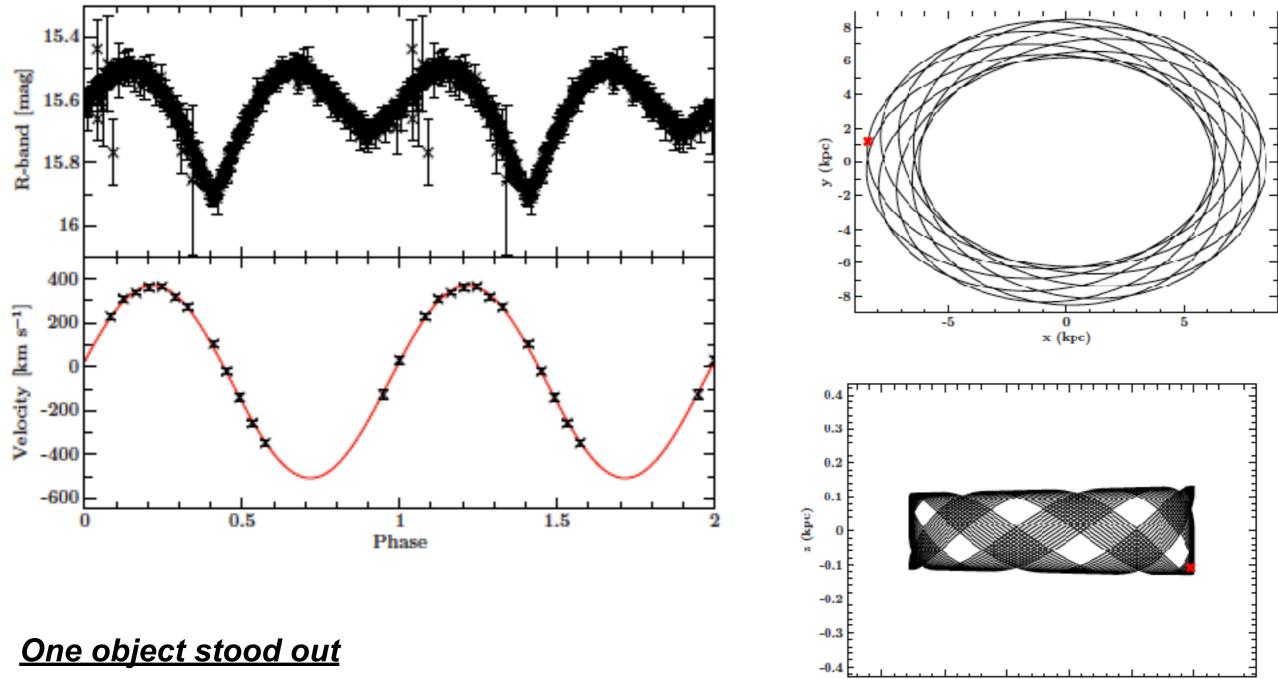
#### ZTF J2130 - The most compact hot subdwarf binary



- very short orbital period: 39min
- velocity and phase shows that this is the shortest period hot subdwarf known
- The lightcurve is remarkable and inconsistent with a simple detached ellipsoidal system



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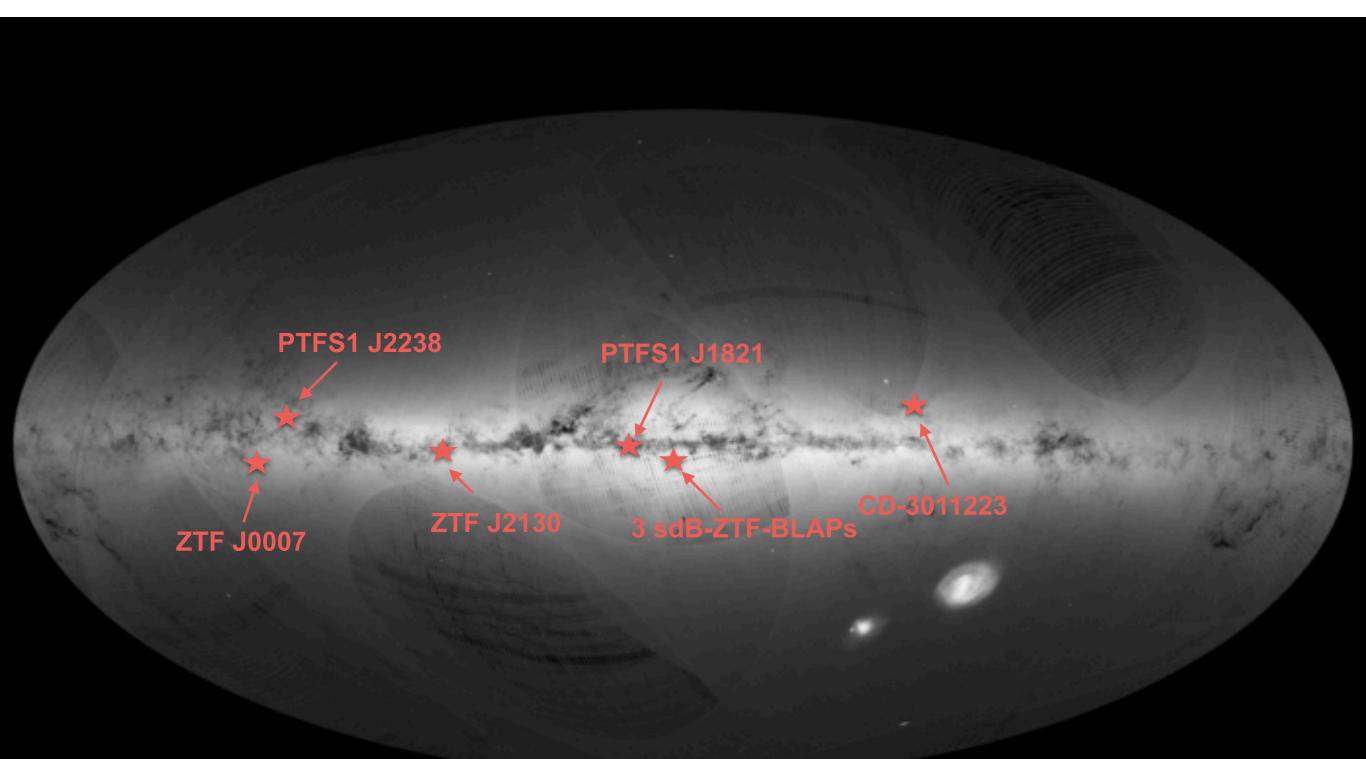
6.5

R (kpc)

- Kinematics shows its a member of the thin disc population

8.5

#### The sky location of the presented 'exotic' variables



All systems are located at low Galactic latitudes



#### Summary

'Exotic' objects can teach us a lot about stellar evolution and stars in general

- Combining many catalogs allow us to select 'exotic' from more 'normal' objects
  - In particular Gaia was a game changer
- Combing with time-domain surveys reveal even more information (e.g. binaries, pulsators)
  - Bottleneck now is follow-up (in particular spectroscopy)
  - Hot subdwarf catalog has about 1 star per square degree.
    - Perfect filler for multi-object spectrographs
      - Little price <-> high return



-

#### Light Curves and Data Products from the Transiting Exoplanet Survey Satellite (TESS)

#### **Ryan J. Oelkers** Vanderbilt University | Rice University

*Carnegie Observatories 2019 Stellar/AGN Photometric Astronomy in the Era of SDSS-V* 

# The Transiting Exoplanet Survey Satellite (TESS)

*TESS* is an all-sky, wide-field survey of solar-type and cooler stars for Earth and Neptune-sized planets.

→ The survey expects to find ~2000 candidates
 (300 Earth-sized objects) using the transit method.

There are 4 cameras, each with 4 CCDs, for a combined field-of-view of 24° x 96° per pointing.

- → 100 mm effective pupil
  - 16.7 megapixel cameras
  - 600-1000 nm bandpass

Ricker et al. 2014, Sullivan et al. 2015

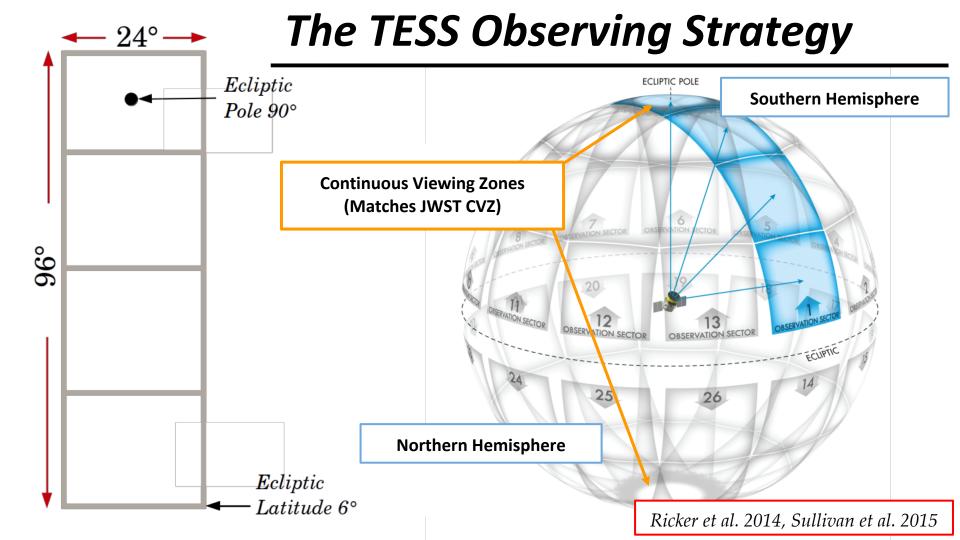
#### The Transiting Exoplanet Survey Satellite (TESS)

200,000-400,000 stars will be observed every 2 minutes, and nearly 420 million stars will be observed every 30 minutes.

→ The stars observed every 30 mins will not have light curves provided by the mission, instead NASA will provide full-frame-images.

There is no proprietary period on the data, and most data products will be available ~4-6 months after downlink. First release was in December, as of early April, 7 Sectors have been released.

Ricker et al. 2014; Sullivan et al. 2015; Stassun et al. 2018



#### **Current Observations**

#### Where is TESS pointed now?

TESS has begun observing Sector 10 in Orbit 27. The pointing direction of the instrument during Sector 10 is:

Ecliptic Longitude (J2000): 199° Ecliptic Latitude (J2000): -54°

RA (J2000): +165° Dec (J2000): -54° Roll (deg): 139°

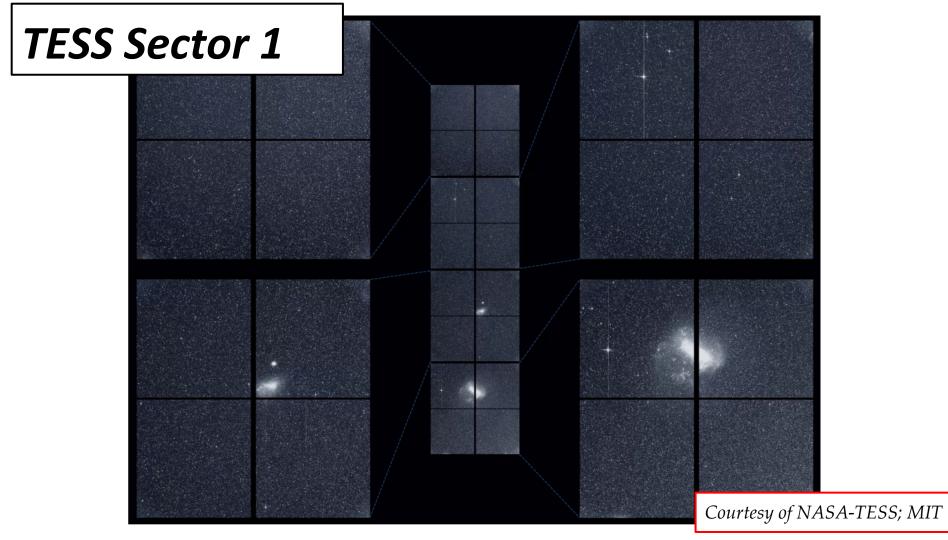
As of 4/13/2019, TESS has completed 9 sectors, with 7 sectors released to the public. The spacecraft is currently observing Sector 10. Northern observations start in July, 2019.

**Northern Hemisphere** 

TESS Science Offic

Courtesy of tess.mit.edu/pointing

Southern Hemisphere



## 'Primary' TESS Data Products

**<u>2-minute cadence light curves</u>:** ~15,000 stars per each sector (for a total near 400,000 stars) will receive 2 minute cadence, and have light curves produced by NASA.

<u>**30-minute cadence FFIs:</u>** All stars in the TESS FoV receive 30-minute cadence in the form of full-frame-images. These are *not* reduced to light curve form. Many groups are producing light curves for the community at large.</u>

<u>**TESS Input Catalog:</u>** Stellar parameters, and a nearly full spectrum of magnitudes for more than 250 million stars -- 1.5 billion stars exist in the TIC with various measured quantities.</u>

### **'Primary' TESS Data Products**

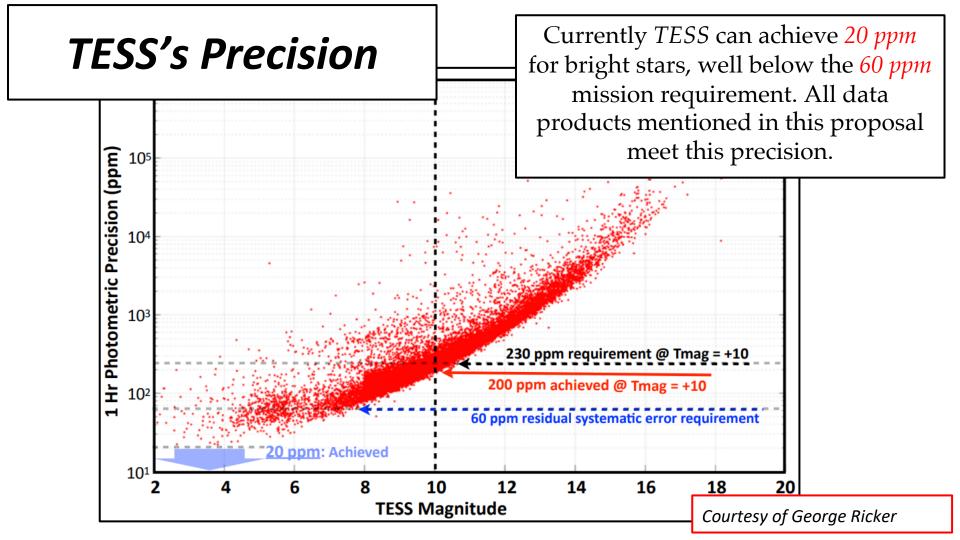
**<u>2-minute cadence light curves</u>**: ~15,000 stars per each sector, for a total near 400,000 stars, receive 2 minute cadence, and have light curves produced by NASA.

<u>30-minu</u> cadence light cur Many more types of data are available through MAST.

0-minute aced to n their

own.

**TESS Input Catalog:** Physical stellar parameters, and nearly full spectrum magnitudes for more than 250 million stars -- 1.5 billion stars exist in the TIC with various measured quantities.



#### A Variety of Official & Community-led Pipelines are Available to Access the Data

**MAST:** Primary location of most mission data products, and provides a variety of tools to access the data.

**NASA:** Official NASA-SPOC data to produce all *NASA-TESS* data products (Jenkins et al. 2016)

**Eleanor:** Open access PSF-fitting pipeline led by University of Chicago (Feinstein et al. 2019)

**Filtergraph:** Open access difference imaging pipeline led by Vanderbilt University (Oelkers & Stassun (2018 & 2019)

**LightKurve:** A package for Kepler & TESS time-series analysis (Barensten et al. 2019)

**Quick-Look Pipeline (QLP):** Aperture photometry pipeline led by MIT (Huang et al. 2018)

**TASOC Pipeline:** PSF photometry data reduction pipeline led by the TESS Asteroseismic Consortium

#### A Variety of Community-led Pipelines are Available to Access the Data

**MAST:** Primary location of most mission data products, and provides a variety of tools to access the data.



**NASA:** Aperture based pipeline with 2-minute cadence

**Quick-look Pipeline:** Aperture photometry pipeline led by MIT

**TASOC:** PSF photometry data reduction pipeline led by the TESS Asteroseismic Consortium

# **TESS Data on MAST**

#### http://archive.stsci.edu/tess/all\_products.html

#### **Bulk Downloads**

- 1-2-minute cadence light curves
- 2-30-minute fill frame images (both calibrated, and un-calibrated)
- 3- Target pixel files for 2-minute data
- 4- Data validation files (TCE summary and full reports)
- 5- Co-trending basis vectors
- 6- Simulated data (ETE-6)
  - 7- The TESS Input Catalog

#### Data interaction tools

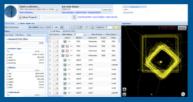
- 1- Search through data: MAST portal, exo.MAST, Astroquery.MAST
- 2- Make FFI cut-outs: TESScut

Slides adapted from a presentation by Scott Fleming

#### **Search Tools**

#### http://archive.stsci.edu/tess/

#### All Search Options 1 TESS Search Tutorials



**MAST Portal** 

Download light curves, target pixel files,

and data validation files for a few targets.

Download full frame images for a few CCDs.

Conduct small searches within the TIC or

CTL. Find data from other missions for

your target.



exo.MAST

Find MAST data (including TESS) for known

planets or TCE's, matched to orbital phase.

Plot sector-stitched DV light curves.

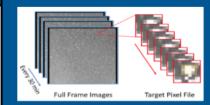
Access exoplanet parameters with

references.

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10 ( ):	shafahla = Weerstinos.gozy.mitoriaida odilenion = 'WEE', energenen.mitoria = 'Yilestinos', energenen.mitoria = ' proposal.i = '*estilizi'; shafahla((f))('betef', 'proposal.j', '' (* (* 11)))
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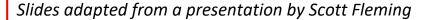
#### **MAST Astroquery**

Search for, and retrieve, TESS data products programmatically based on a list of coordinates or target names. Interact with observational data, TIC, and CTL catalogs in programs you write.



#### TESScut

Create time series pixel cutouts from the TESS full frame images. Find out what sectors/cameras/detectors a target was observed in.



#### Simulated TESS Data Products Ara to exceed and product instructions and divolvy information. TIC and CTL Bulk Downloads Mark to Clin of Clin Semandar algo be pill his Identifies as nor the. Bulk Download Of FFIs, Target Files, Light Curve, and DV Files By Sector And examined the bir algorithm the pill right, Scheller Burget and DV Files By Sector And examined the bir algorithm the pill right. Scheller Burget Birght, Light Core, or Target Piller, Light Curve, and Data Validation Files By Guest Investigator Program Cale Research Program The Sector Program Development of CEC Catalogs In CSV Format Ara to Target Piller, Burget by the tar. and with a diret Treatment Count (TCD) Markets have a given Development of the Data Validation Sector (TCD) Markets have a given Development of the Data Validation Sector (TCD) Markets have a given Development of the Data Validation of the Treatment of the Data Validation Sector (TCD) Markets have a given a diret or the pill relationship topic as well the diret Treatment County Development these a given Development of the Data Validation Sector (TCD) Markets have a given a diret or the pill relationship topic as well the diret Treatment Down (TCD) Markets have a given a diret or the pill relationship topic as well the diret Treatment Down (TCD) Markets have a given a diret or the pill relationship topic as well the diret Treatment Down (TCD) Markets have a given a diret or the pill relationship topic as well the diret Treatment Down (TCD) Markets have a given a diret or the pill relationship topic as well the diret Treatment Down (TCD) Markets have a given a diret or the pill relationship topic as well the diret or the time of the treatment of

#### **Bulk Downloads**

Download all light curves or target pixel files for a given sector or GI program. Download all full frame images for a given sector. Download the entire TCE table for a given sector. Download versions of the TIC and CTL.



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Well Asservation of Well Section 1.6.2, and in strating conference on a sected work threads that there is transmission with the well section of the secti

#### Accessing the data

TESS data available on AWS

n orkan followe, we are garleg to assocrate polynologically have an AMRS account, have created <u>AMRS</u> anoth access keys and are shift to polyne an antiber founded peoplag subsystem occurs. Pythonanchinge with threat keys.

#### Amazon Web Services

Access all the publicly available TESS data directly in the AWS cloud. Calibrated and uncalibrated full frame images, two-minute cadence target pixel and light curve files, and co-trending basis vectors, and FFI cubes available on Amazon S3. Also accessible using astroquery.mast.

# **Official NASA-SPOC Data**

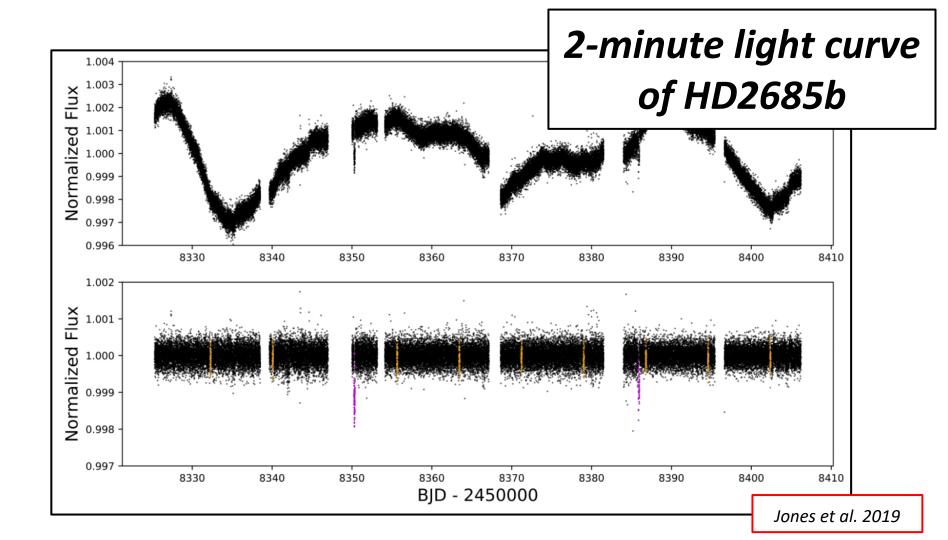
#### Stars provided in the official releases:

- 1- The main data product from NASA-SPOC are light curves for
- 2-minute cadence targets.
- 2- Typically there are ~15,000 stars per sector which receive 2-minute cadence. These stars were selected based on priority in the candidate target list (CTL) of the TIC, the Asteroseismic Target List (ATL), GI/GO targets, and other special target lists.
  3- The pipeline is heavily based on the *Kepler* pipeline.

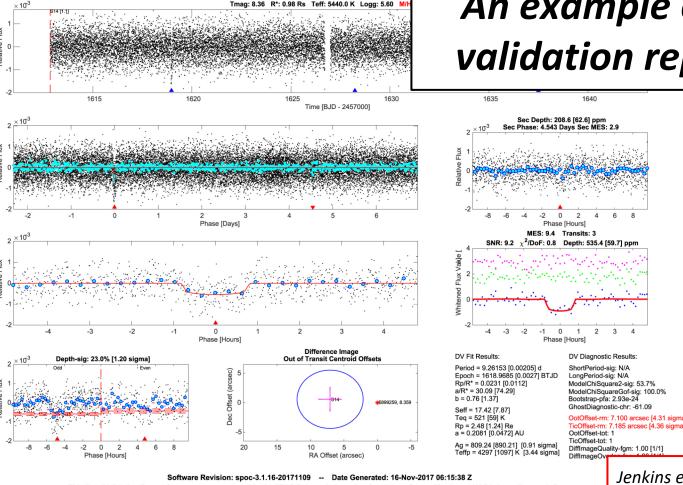
Data Products: Hosted on MAST (DATA available through Sector-7 as of 4/13/19)

- 1-2-minute light curves
- 2- Data validation reports and TCE reports
- 3- 30-minute (un-)calibrated Full Frame Images
- 4- Co-basis detrending vectors

Jenkins et al. 2016 & 2018







Candidate: 1 of 1 Period: 9.262 d

IC: 5899259

This Data Validation Report Summary was produced in the TESS Science Processing Operations Center Pipeline at NASA Ames Research Center

Jenkins et al. 2018

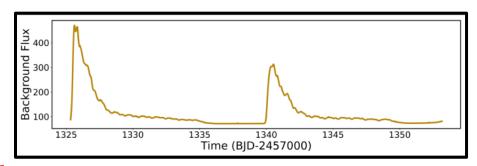
# Community Generated Light Curves and Ancillary Data Products

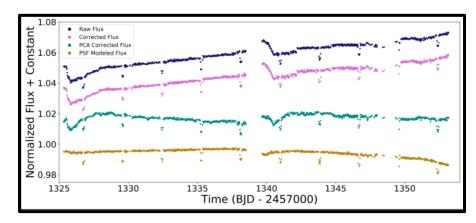
#### Courtesy of Adina Feinstein

#### **ELEANOR** Pipeline

(Feinstein, Montet, Bedell, Christiansen, Foreman-Mackey, Hedges, Luger, Saunders, Cardoso)

- Creating light curves for all stars < 16 magnitude in the FFIs and searching them for exoplanets
- Open-source software and light curves for Sector 1 are ready for use for all your time-series photometry needs.
- We remove noticeable background noise
- Principal Component Analysis of thousands of stars enables contending to remove shared Systematics.
- PSF modeling is also available



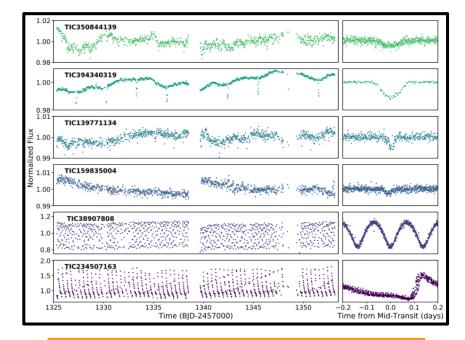


#### Courtesy of Adina Feinstein

# **ELEANOR** Pipeline

- We already have new exoplanet, eclipsing binary, and other candidates!
- Light curves will be hosted on MAST soon
- New exoplanet candidates are already being uploaded to ExoFOP-TESS!

Can't wait until the light curves are uploaded? *Make your own!* 



#### pip install eleanor https://adina.feinste.in/eleanor

#### Filtergraph Pipeline (Oelkers & Stassun)

**Pipeline Availability:** *https://github.com/ryanoelkers/DIA/* 

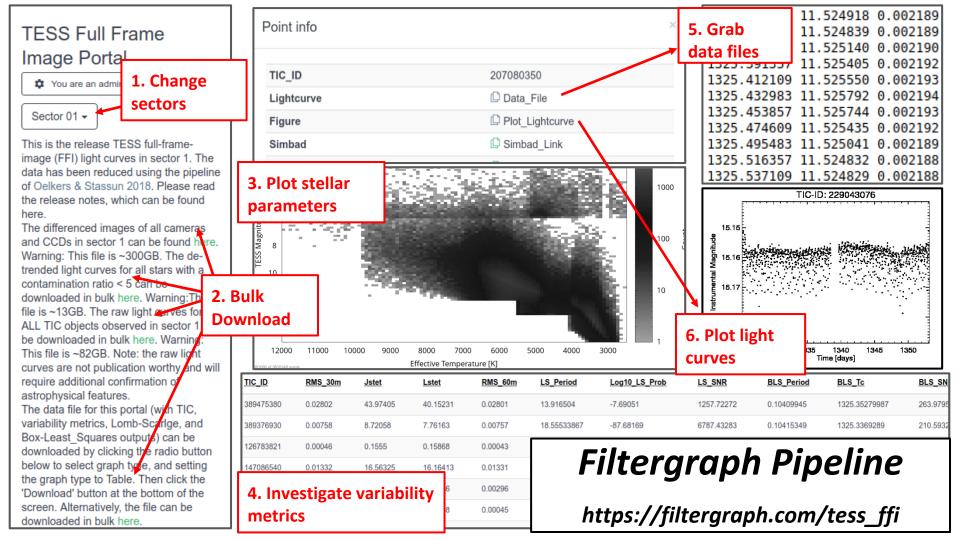
1- Difference imaging C-code

2- Wrappers and various routines for background subtraction, alignment,

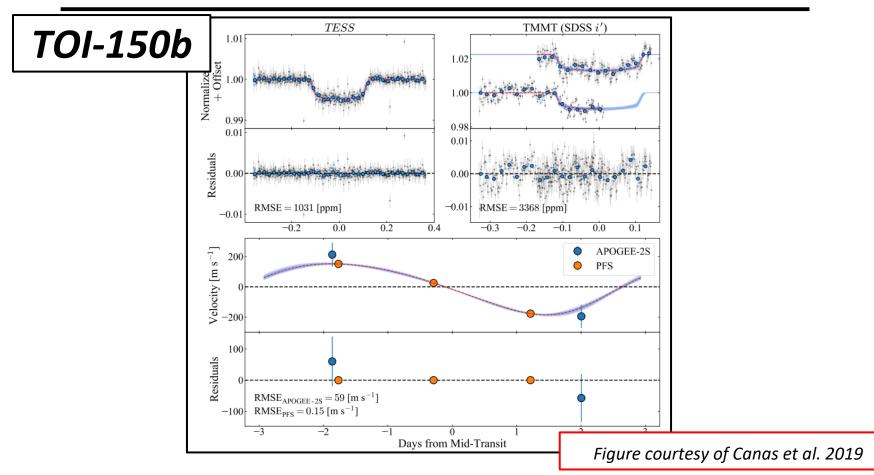
master frame combination, de-trending and photometry.

**Data Products:** *https://filtergraph/tess\_ffi/* **(DATA available through Sector-5)** 1- *TESS* Input Catalog information (Stassun,Oelkers+2018)

- 2- Variability metrics and basic periodicity information
  - → Box-Least-Squares output from VARTOOLS (Kovacs+2002; Hartman & Bakos 2016)
  - → Lomb-Scargle output from VARTOOLS (Lomb 1976; Scargle 1982; Hartman & Bakos 2016)
  - → Welch-Stetson J & L metrics and rms on 30m and 60m timescales (Stetson 1996; Oelkers+2018)
- 3- Light curves
- → Raw light curves for every star, cleaned light curves for a subset of low-contamination stars
   4- Differenced images
  - $\rightarrow$  Useful for discovering transients, and/or variable stars previously unknown.



### Filtergraph Pipeline



# LightKurve Package

(Cardoso, Barentsen, Cody, Hedges, Gully-Santiago, Barclay, Mighell, Bell, Zhang, Tzanidakis. Sagear, Turtelboom, Coughlin, Berta-Thompson, Sundaram, Hall, Saunders, Lerma, Evensberget, Gosnell, Williams, Elkins, Davies, Foreman-Mackey, Hey)

**Availability:** *https://docs.lightkurve.org/index.html* 

Lightkurve provides a user-friendly, low-barrier-to-entry, method of interacting with data from *Kepler* and *TESS*.

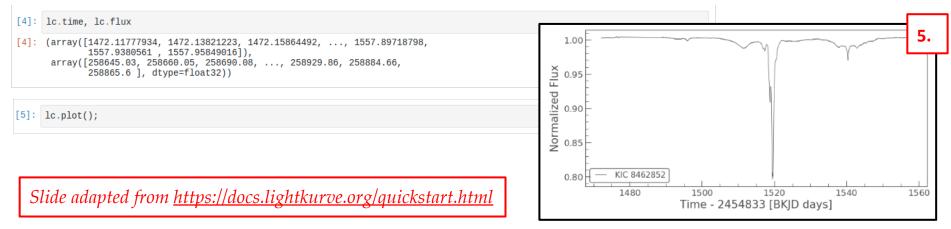
→ Written in **PYTHON** it can be installed, and used quickly.

→ Provides users opportunities to access *Kepler* and *TESS* data, plot light curves, correct for systematics, identify trends, and find periodic signals.

Slide adapted from <u>https://docs.lightkurve.org/</u>

# LightKurve Package



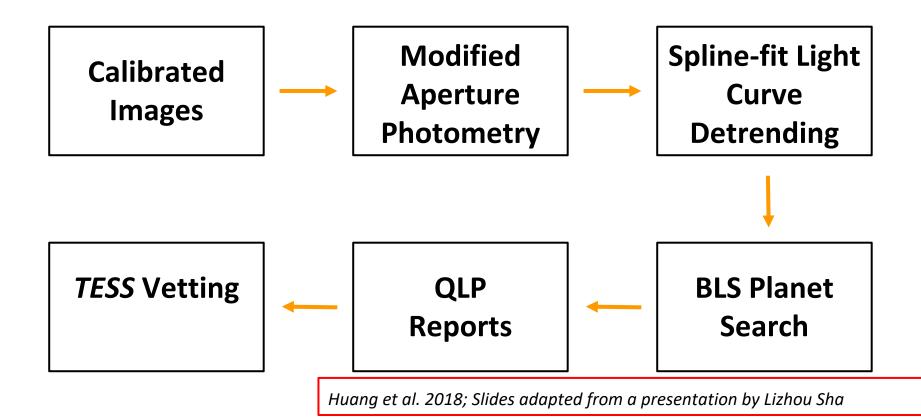


# **TASOC** Pipeline

# **TASOC** Pipeline

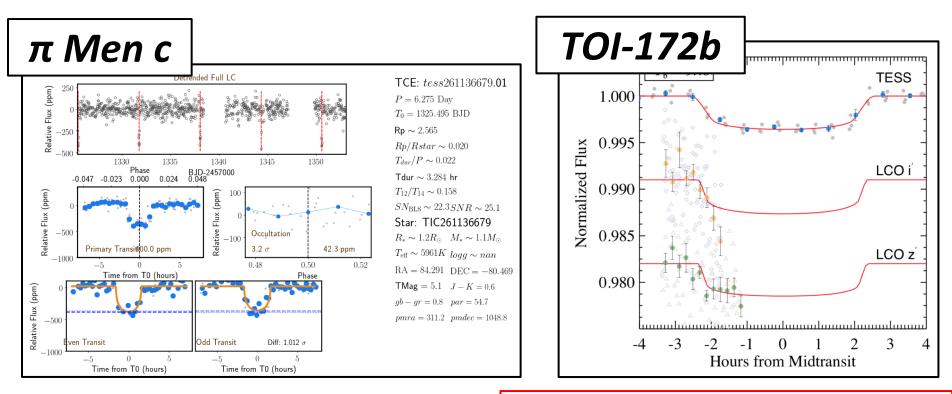
#### MIT Quick-Look Pipeline (QLP)

(Huang, Pál, Vanderburg, Yu, Fausnaugh, Shporer, and the TESS team)

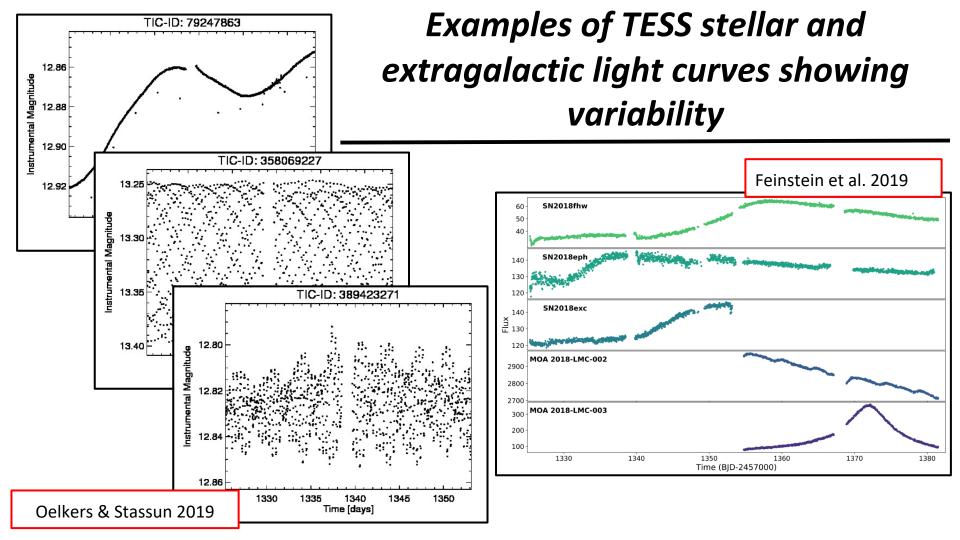


#### MIT Quick-Look Pipeline (QLP)

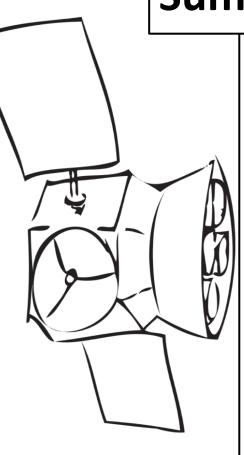
п Men c: Huang et al. 2018; TOI-271b: Rodriguez at el. 2019



Slides adapted from a presentation by Lizhou Sha



#### Summary



*TESS* is currently observing in Sector 10, with 7 sectors of data already released.

Most of the available data products can be found on MAST.

- 2-minute light curves
  - 30-minute full frame images
- **TESS Input Catalog**
- Data validation reports

There are numerous community-led pipelines, already producing data light curves for 30-minute full frame images.

TESS has shown capabilities of detecting variability in stars and extra-galactic sources!

# Towards precision Astromety & photometry from the ground

# Eran Ofek

#### Weizmann Institute of Science

With: N. Segev, O. Springer, D. Polishook, B. Zackay, J. Lu, A. Goobar, E. Waxman, I. Arcavi



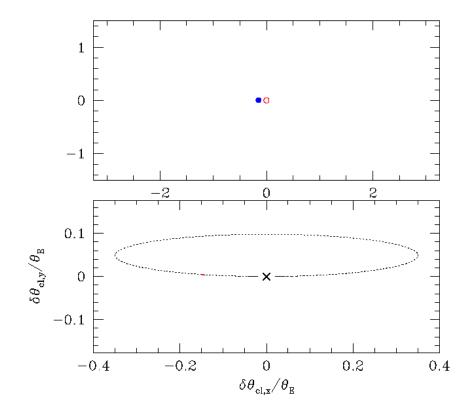
# Outline

- Motivation for astrometry & photometry
  - Search for isolated stellar-mass BH
  - Binary asteroids
  - Lensed quasars and time delay
  - GW170817 jet
  - exoplanets
- Ground based astrometry
  - Limitations
  - Progress
- Ground based photometry
  - Limitations
  - Progress



# Astrometric microlensing

$$\theta_E = \sqrt{\frac{4GM}{c^2} \frac{d_{ls}}{d_s d_l}}$$



TDA May, 2019

# Search for compact objects

- Stellar-mass isolated BH/NS: product of stellar evolution
- Counting, and mass-function -> stellar death, GW,...

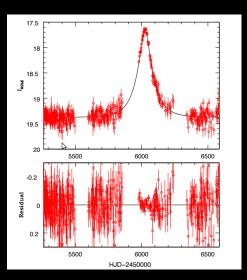
Targets:

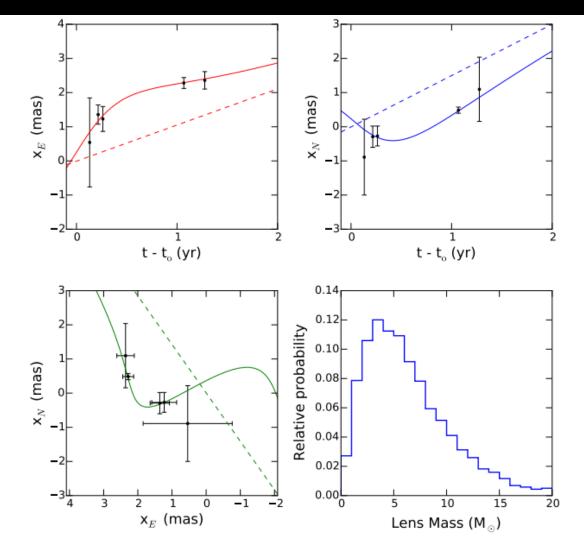
- ML surveys (w/ long duration) i.e., Lu et al. (2016)
- GAIA predictions (e.g., Bramich+2018, Ofek 2018)
   High gal. lat blind surveys (e.g., ZTF)

#### Astrometry & Photometry

A search (with: J. Lu+)

OB120169
Best fit:
First 5 yr

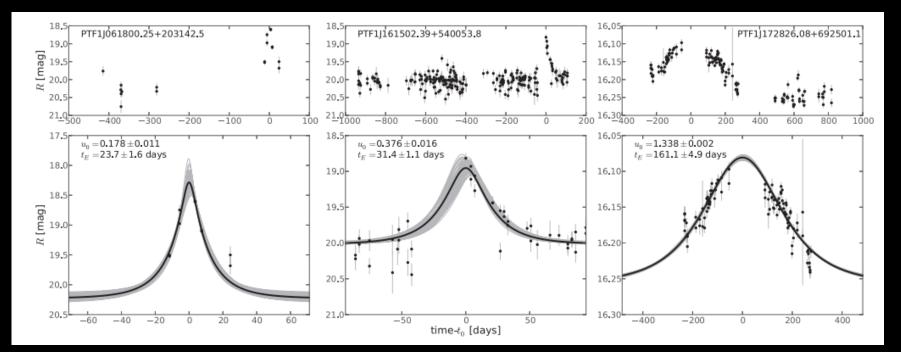




# Lu et al. 2016 ApJ 830, 41

## Relative Astrometry with ZTF

# ZTF can find (very rare) high Galactic latitude ML events (nearby->large θ<sub>E</sub>) Candidates from PTF:



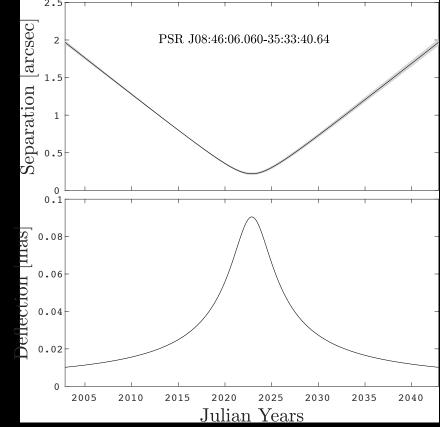
TDA

May, 2019

Price-Whelan et al. 2014

# Lensing by pulsars

# Another possibility: detecting astrometric lensing of known pulsars on background stars



Ofek 2018, ApJ

May, 2019

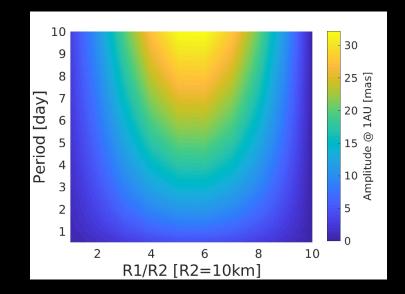
TDA

# <u>Binary asteroids</u>



Characterizing binary asteroids is important for understanding the YORP effect

- Methods: radar, light curves, imaging,...
- Detection using the Center of light motion
   (Segev et al., in prep.)



# Lensed quasars / time delays



• Time delay measurements of lensed quasars offers an independent method for measuring  $H_0$ .

 Hindered by: model dependent and systematics – requires large sample.

Expensive!

Springer+ in prep. – using Astrometry...

# Why not GAIA?

# Cadence is too sparse for some applications

Missing some objects (e.g., GW170817)





## Precision photometry motivation

- Search for transiting exoplanets
- Oebris around WDs
- Role of massive spectroscopy: radial velocities



Sub mas astrometry from the ground? • With AO 100-200 µas is possible • With GRAVITY ~tens µas is doable For seeing limited Monet (1983) claimed 1 mas parallax accuracy, but... All methods are likely limited by systematics(!)



# <u>Astrometry – limiting factors</u>

- Poisson noise: FWHM/√N<sub>ph</sub>~1 mas
- Optical distortions: ~1"/deg
- Atmospheric refraction: ~2"/deg
- Color refraction: ~a few mas
- Aberration of light: 0.5"/deg
- Grav. Deflection: ~0.1 mas/deg
- At. scintillation: FWHM/(Exp/ $\tau_{sc}$ )~20mas

#### Systematics:

 My leading suspect – non uniformities in detectors – a few milipixel(?)

Have mo

#### Astrometry & Photometry

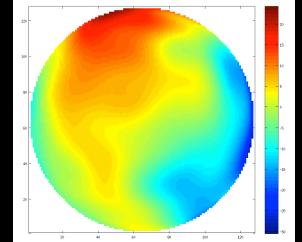
# The turbulent atmosphere & the PSF Distorted wavefront Telescope

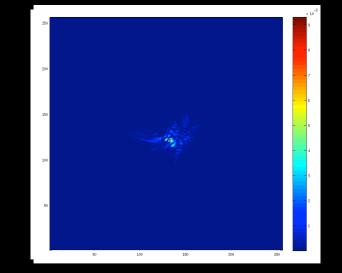
Turbulent

atmosphere

#### Planar wavefront







Eran Ofek

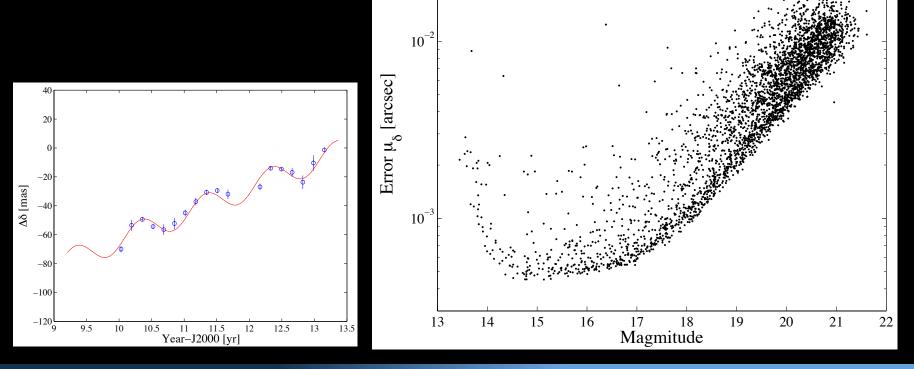


-ocal plane

### Before GAIA ...

### Relative astrometry w/PTF

OPROBLEM: difficult to estimate if the results are biased



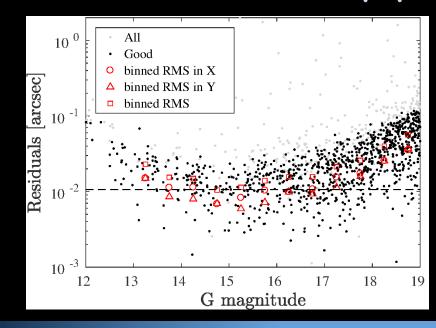
### Eran Ofek

```
May, 2019
```

TDA

### Astrometry relative to GAIA

- New astrometry code performances:
- Failure rate ~<1 in 50,000</p>
- Typical rms w/PTF: 14 mas (2 axes comb.)
- ~2-3 times better than ZTF pipeline

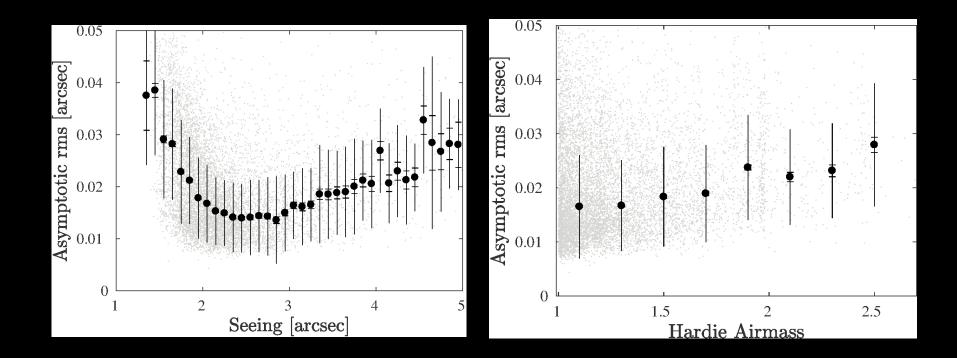


Eran Ofek



### Astrometry relative to GAIA

### New astrometry code – performances:



May, 2019

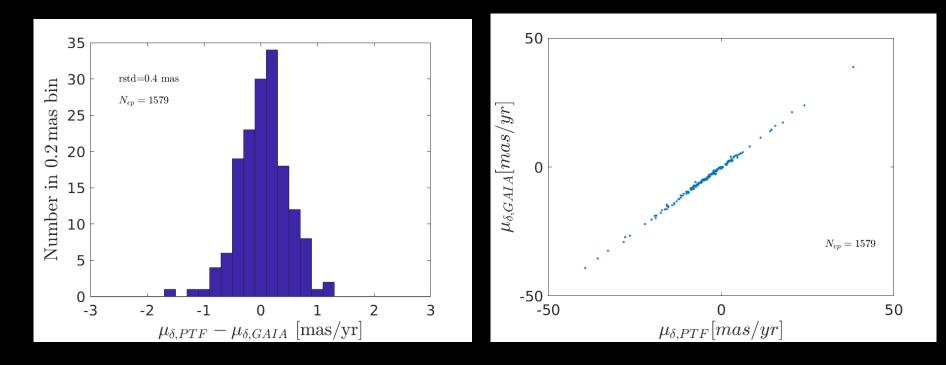
TDA

### Eran Ofek

Astrometry & Photometry

Comparison w/GAIA

# Use GAIA to verify results ~0.4 mas/yr in PM over 7 years



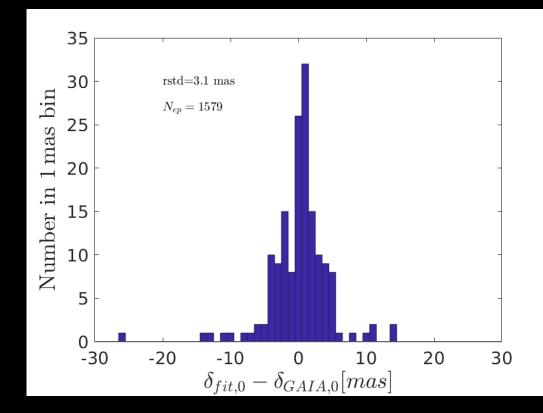
Eran Ofek

TDA May, 2019

## Comparison w/GAIA

but ~3mas error in positions (w/1500 images)
 Predicted Poisson noise: 14/sqrt(1500)~0.4 mas

Systematics!

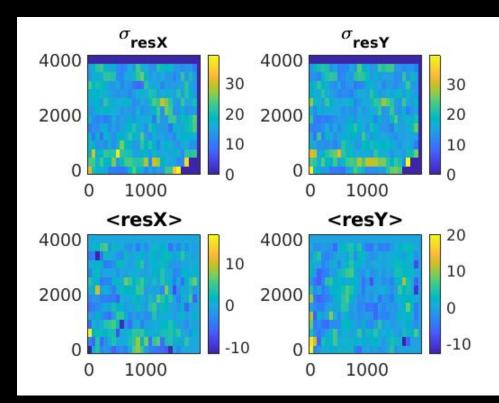


May, 2019

TDA

## Searching for systematics

- Pixel size variations?
- Requires simultaneous solution



TDA

May, 2019

### Eran Ofek

## Conclusion / Astrometry

- Ground based seeing limited astrometry is useful
- We currently able to measure stellar positions to accuracy of about 3mas
- We are limited by systematic noise
- Next: trying to beat the systematics

## Precision photometry / Limitations

TDA

May, 2019

- Flat fielding errors Separate scattered light Color dependency Scintillations Intensity scintillations Phase scintillations Transparency
  - Correlated noise

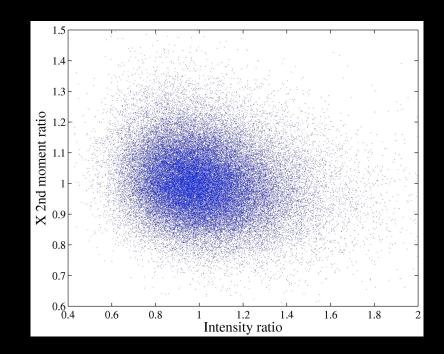
# Precision photometry / Mitigation

- Flat fielding errors
  - TDI
  - Out of focus / small pixels
  - Keep star on the same pixel (hard)

## Scintillations

ML?

- Aperture corrections
- Fast imaging!
- Transparency [progress]
   Model and filtering
   Fast imaging!



TDA



May, 2019

### Eran Ofek

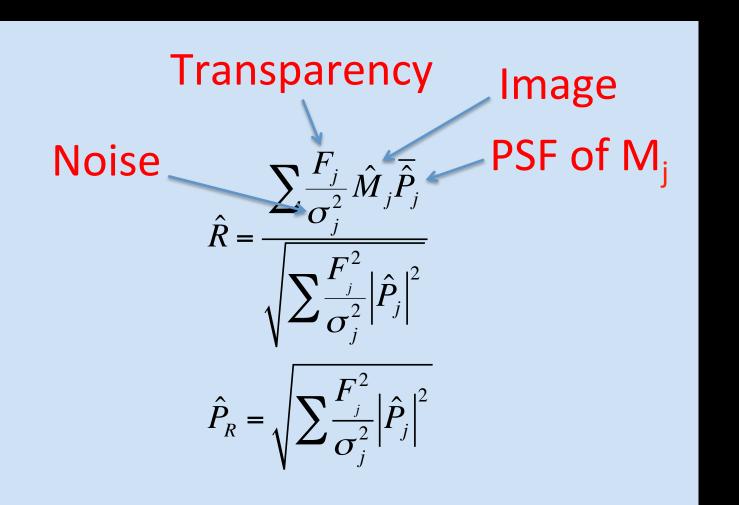
# End





Astrometry & Photometry

# **Optimal Image coaddition**



Zackay & EO 15a; 15b

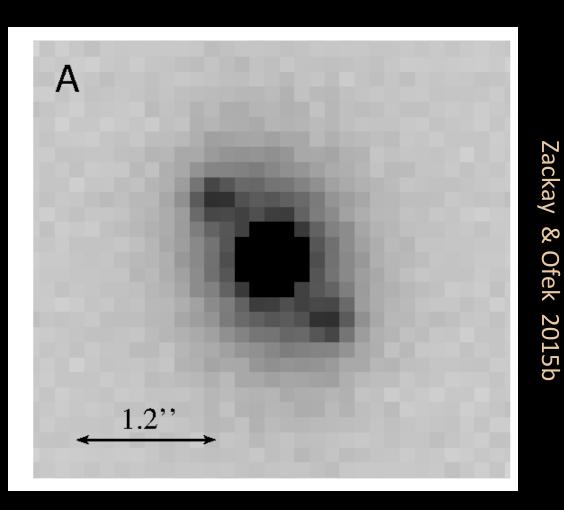
May, 2019

TDA

#### Eran Ofek

Astrometry & Photometry

# Coaddition: Tests on real images





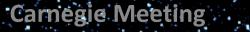


# The All-Sky Automated Survey for SuperNovae (ASAS SN or "Assassin")

## Benjamin J. Shappee

### University of Hawai'i









# ASAS SA Approach:

- Monitors the entire sky every 20 hours in real-time
- g-band limiting magnitude ≈ 18.5
- Use commercially available Telephoto lenses and CCDs
- Find supernovae in a minimally biased search
- Announce discoveries **publicly**

# ASAS SN Is a Global Partnership

CASSACA

FCAPF

AARHUS UNIVERSITY

NÚCLEO DE

ULTAD DE INGENIERÍA

os Alamos

LIVERPOOL

ORES

PEKING

(University of Hawaii) C. S. Kochanek, K. Z. Stanek, T. A. Thompson, J. F. Beacom, J. Brown, T. Jayasinghe, G. Simonian P. Vallely, Josh Shields (Ohio State) T. W.-S. Holoien (Carnegie Observatories) J. L. Prieto (Diego Portales), D. Bersier (LJMU) Subo Dong, Ping Chen, S. Bose (KIAA-PKU) M. Stritzinger, Simon Holmbo (Aarhus University) L. Chomiuk, J. Strader (Michigan State) Anna Franckowiak (DESY); Katie Auchettl (DARK) Ondřej Pejcha, Michał Pawlak (Charles University) Xinu Dai (University of Oklahoma); David Martinez-Delgado (Heidelberg); P. R. Wozniak (LANL), E. Falco (CfA) N. Morrell (Carnegie Observatories) J. Brimacombe (Coral Towers Observatory) G. Pojmanski (Warsaw University)

B. J. Shappee, M. Tucker, A. Payne, A, Do, K. Hart

# MOORE ASAS SN



CASSACA

Late-2019



PEKING UNIVERSITY





CAPP



# ASAS SA units

- 4 telescopes per mount
- 14cm lens, 2k × 2k thinned CCDs
  - 4.47 × 4.47 degree field-of-view
  - 7.8" pixel scale
  - g-band filters
  - limiting magnitude ≈ 18.5
  - ≈6500 images per night
  - 40,000 square degrees per night



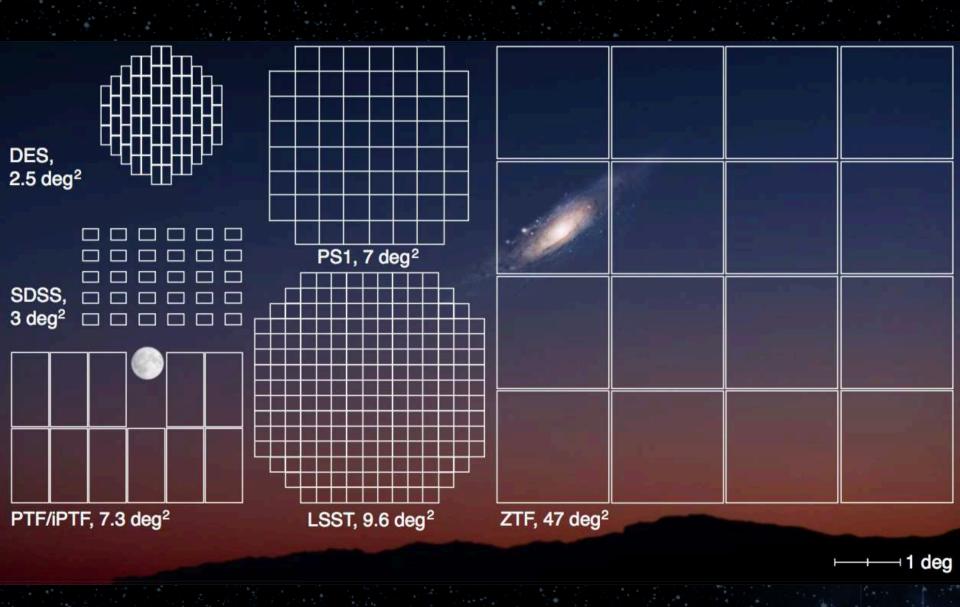
Picture Courtesy of Jon De Vera

# ASAS SN "Tian Shan"

- 6<sup>th</sup> unit by the end of 2019
- 4 more telescopes
- Nanshan Station of Xinjiang Astronomical Observatory
  - Funds from Peking University using the government funding "Double First Class University Plan"



Pictures Courtesy of Xinjiang Astronomical Observatory and wikicommons





### ASAS SN DES, 2.5 deg<sup>2</sup> PS1, 7 deg<sup>2</sup> 2 SDSS, PTF/iPTF, 7.3 deg<sup>2</sup> LSST, 9.6 deg<sup>2</sup>

## 4 cameras per unit = $80 \text{ deg}^2$

### Currently 5 units = $400 \text{ deg}^2$ DES, 2.5 deg<sup>2</sup> PS1, 7 deg<sup>2</sup> SDSS, \_\_\_\_\_ 3 dea<sup>2</sup> ی و و و و و و و و ZTF, 47 deg<sup>2</sup> PTF/iPTF, 7.3 deg<sup>2</sup> LSST, 9.6 deg<sup>2</sup> i deg

# **Follow-up Facilities**

- UH88
- Keck

 $\bullet$ 

- LCOGT 1 meters
- Magellan 2 x 6.5 meter
- LBT 2 x 8.4 meter
- Du Pont 2.5 meter
- MDM 2.4 meter
- Liverpool Telescope 2 meter
- Swift satellite
- many others (SALT, FLWO 1.5m, NOT 2.5m, Faulkes, HST, Chandra, VLA ...)



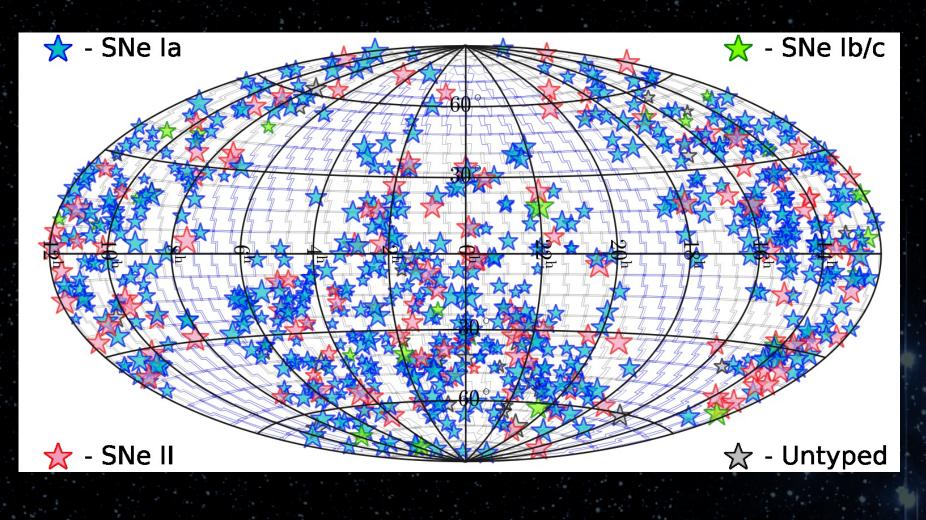




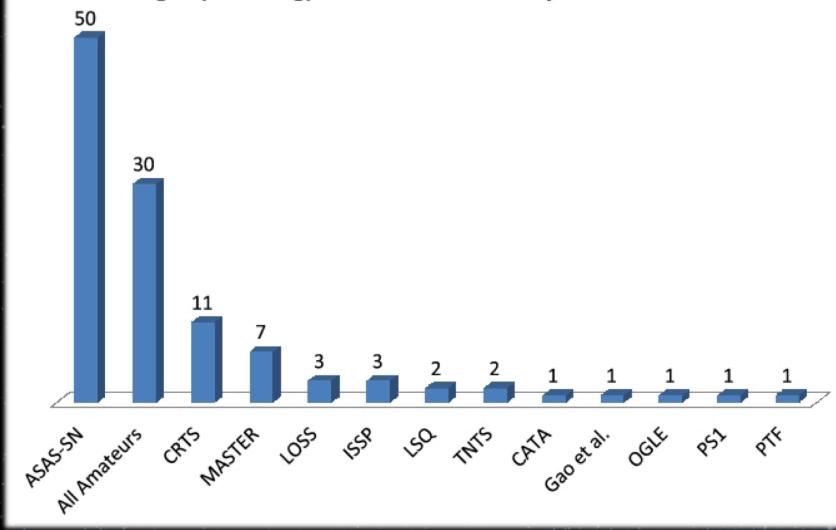


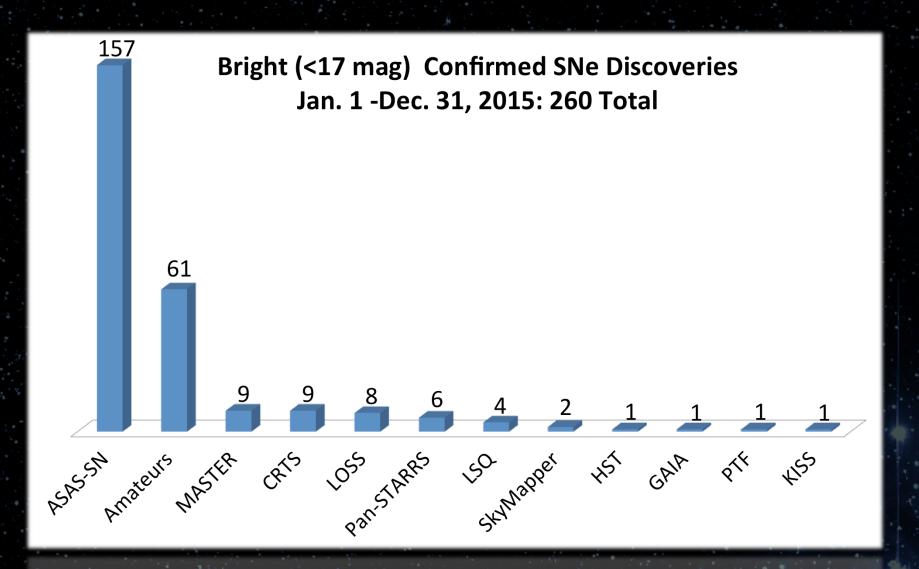
# **ASAS SN** Supernovae Discoveries

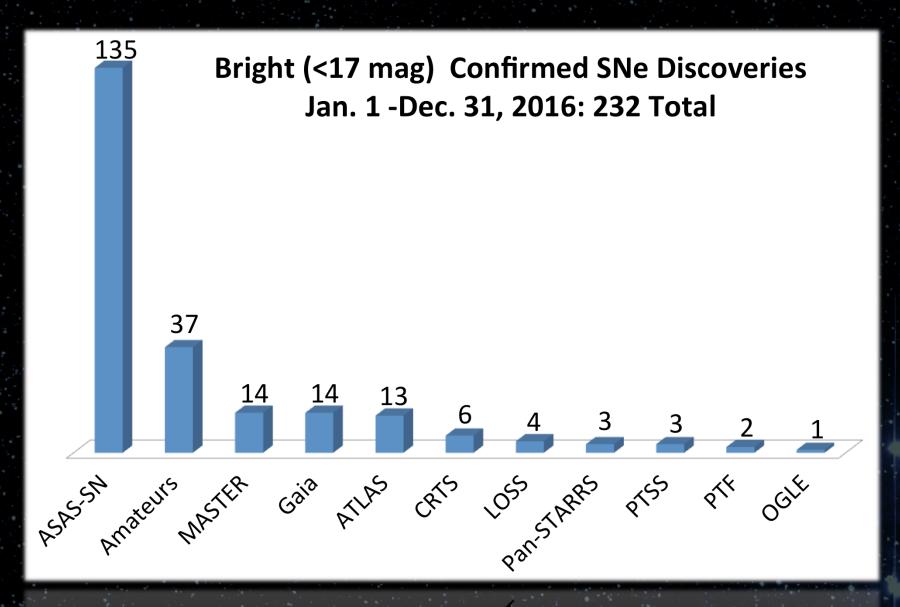
### 800+ Supernovae

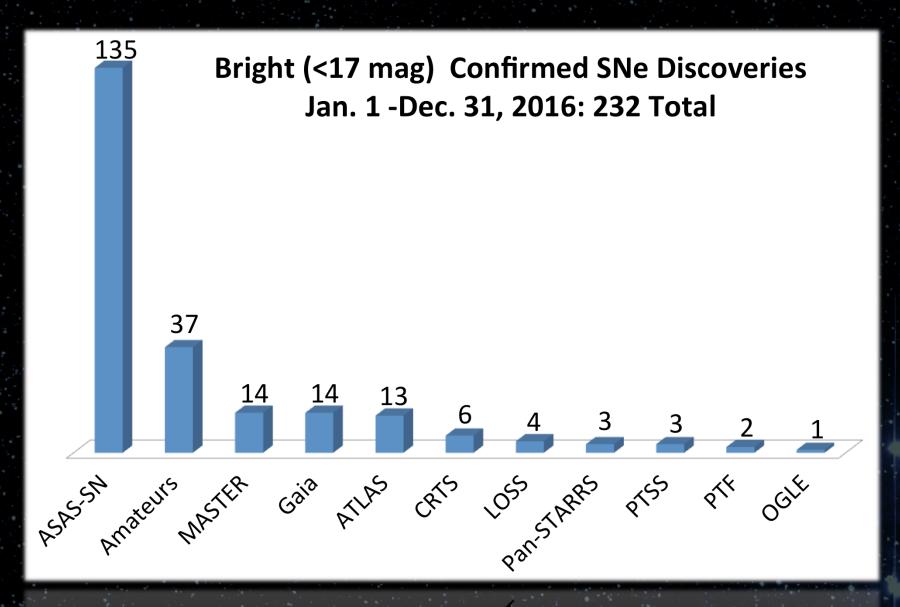


### Bright (<17 Mag) SNe Discoveries May 1 - Nov. 1, 2014



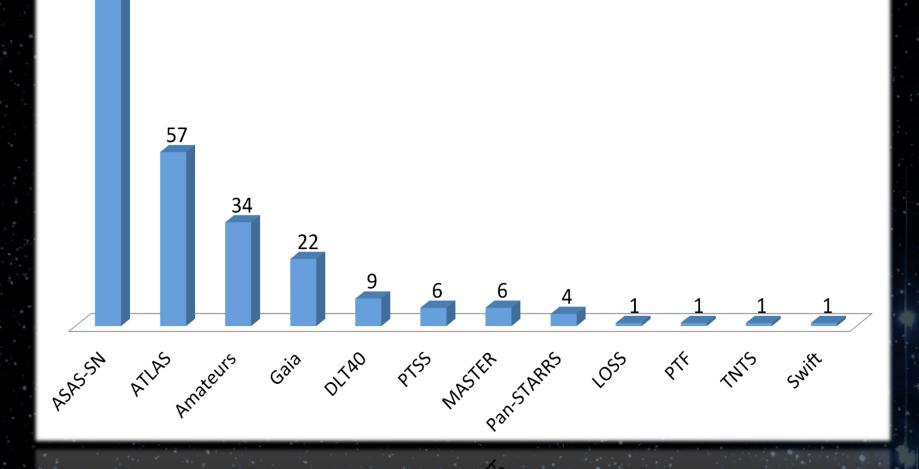


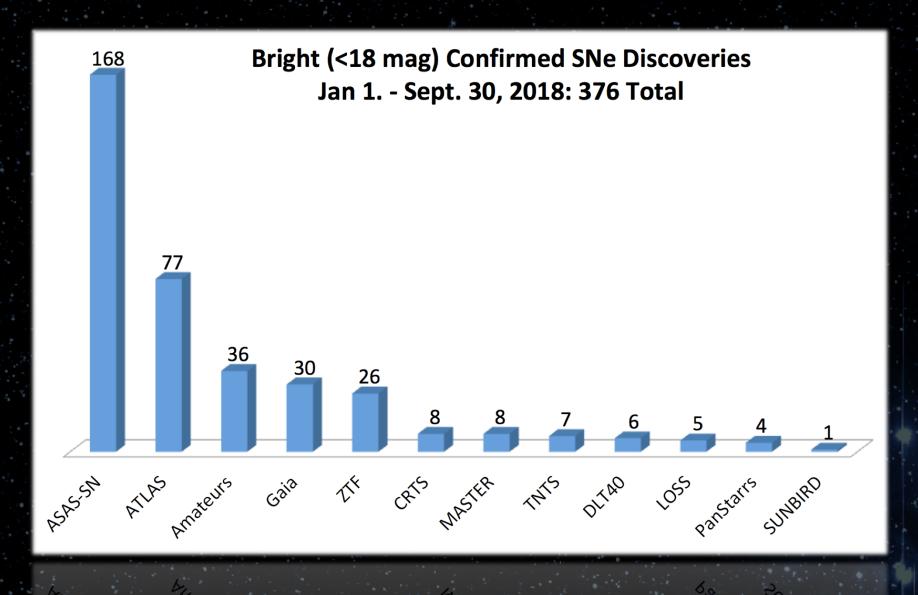




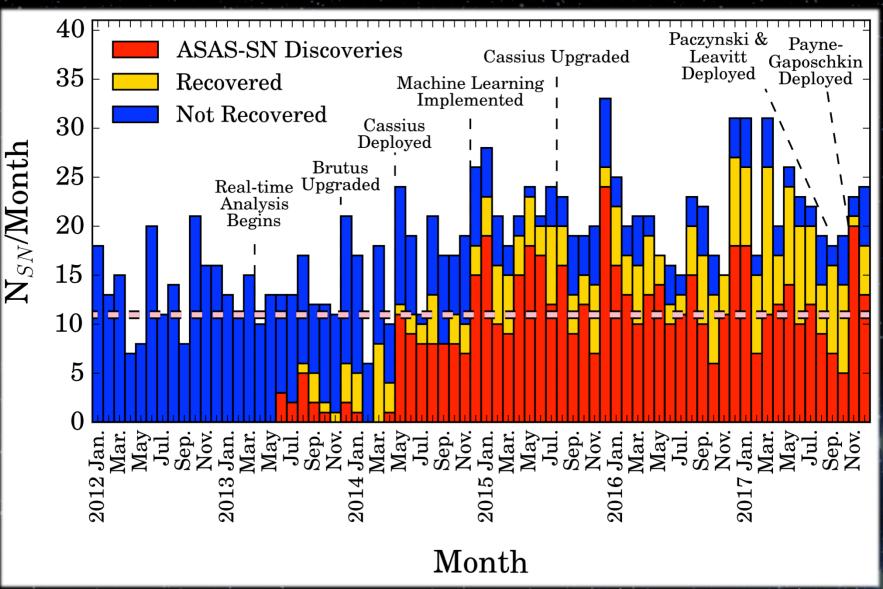
134

Bright (<17 mag) Confirmed SNe Discoveries Jan 1. - Dec 31, 2017: 276 Total



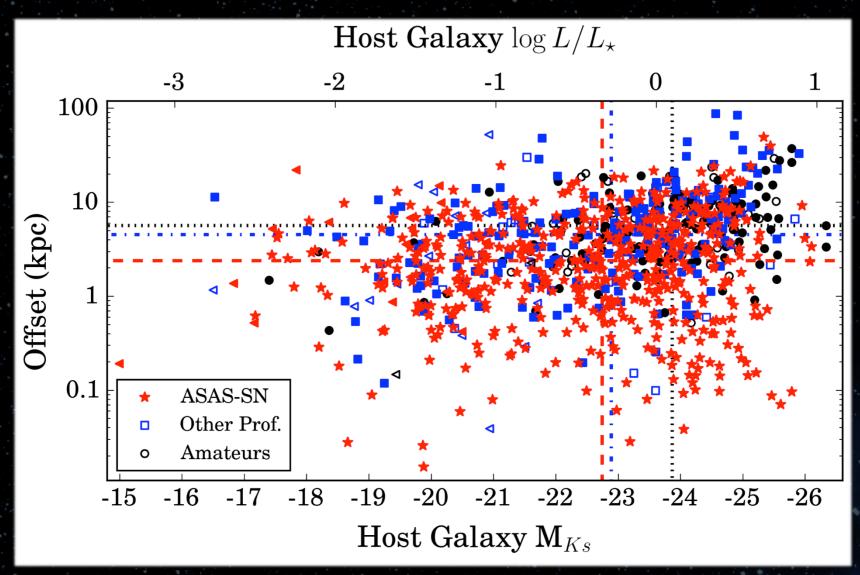


# We are more complete, unbiased.



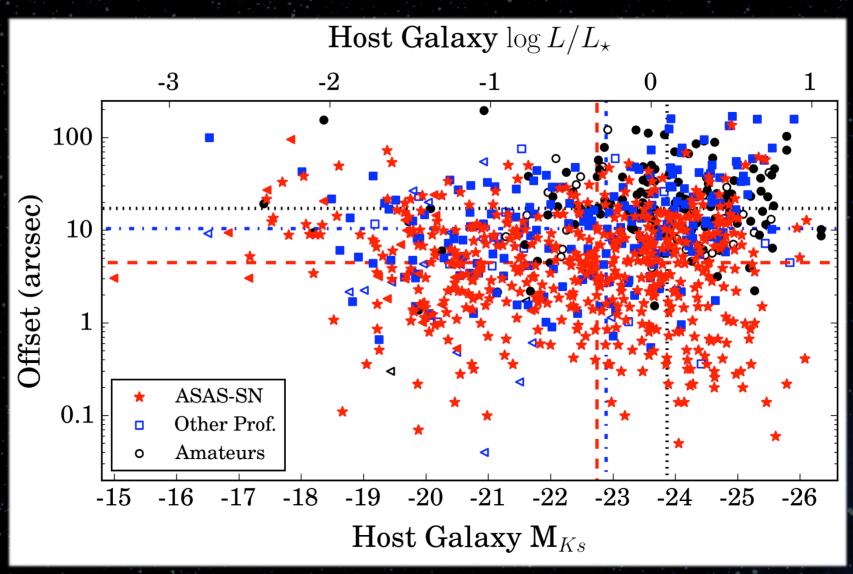
Holoien et al. (incl. Shappee) 2017b

## The first unbiased supernova sample



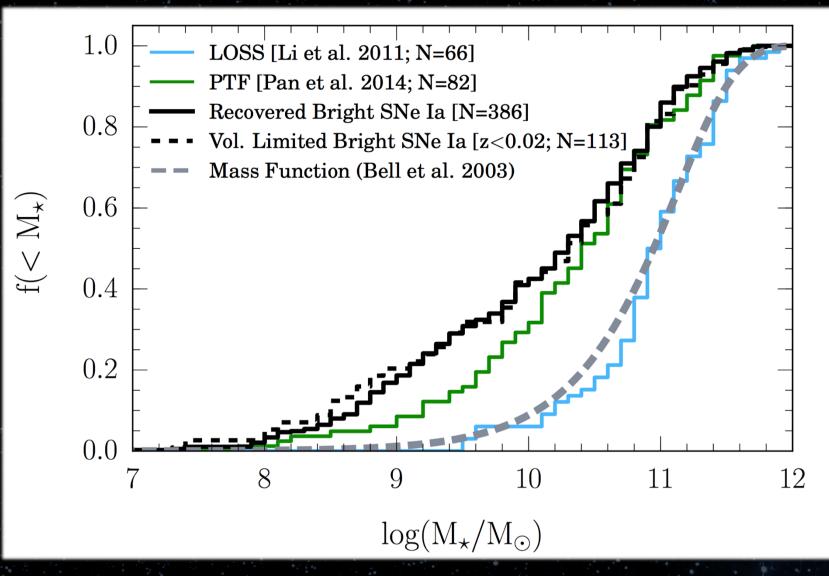
Holoien et al. (incl. Shappee) 2018c

## The first unbiased supernova sample



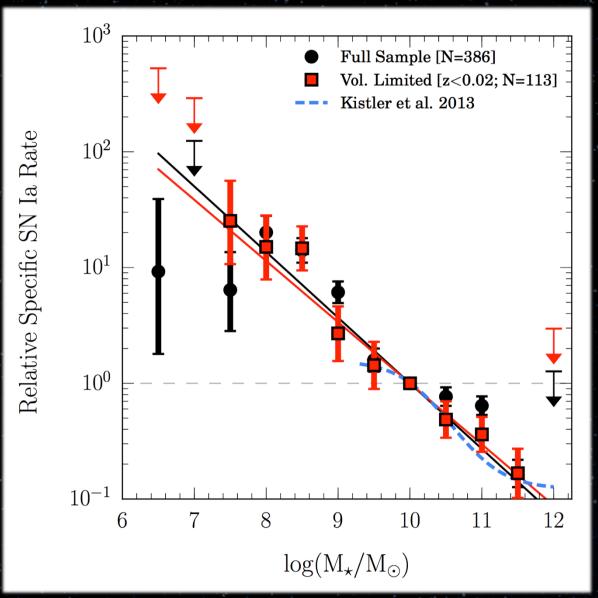
Holoien et al. (incl. Shappee) 2018c

## Unbiased rate measurement



Brown et al. (incl. Shappee) 2018

## Unbiased rate measurement



Brown et al. (incl. Shappee) 2018

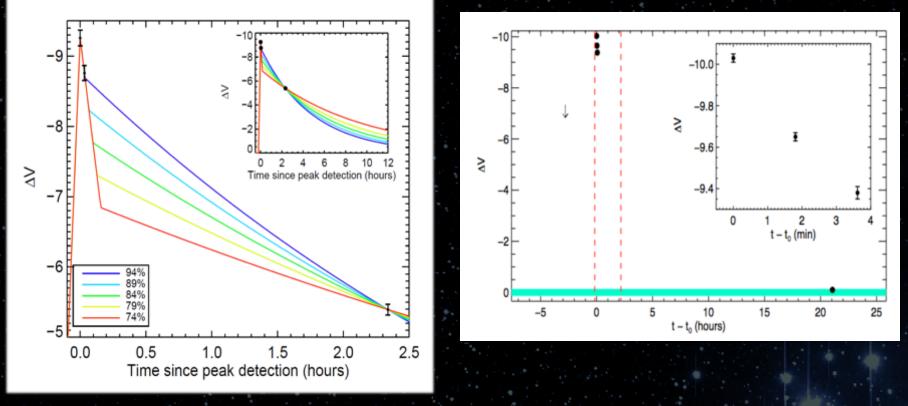
# Other science highlights so far

50+ publications, 750+ ATels, 1000+ new cataclysmic variable, novae search, 2 comets, and growing.

#### Dramatic Stellar Flares in ASAS SN

#### ASASSN-13cb

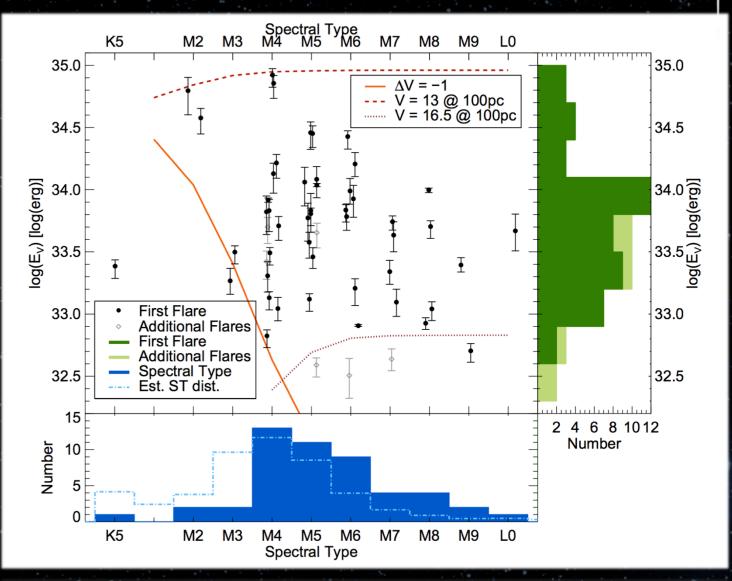
#### ASASSN-16ae



Schmidt et al. (incl. Shappee) 2016

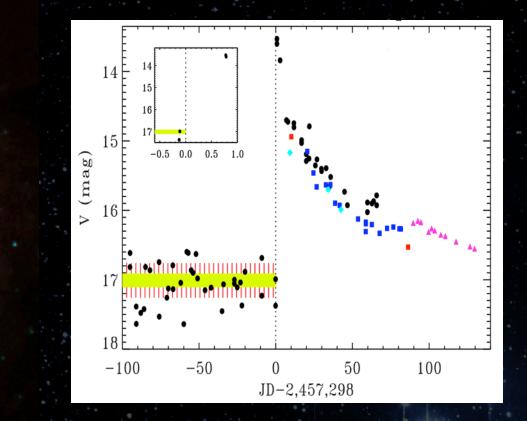
Schmidt, Shappee et al. 2016

#### Dramatic Stellar Flares in ASAS SN



Schmidt, Shappee et al. 2018

#### **Outbursts from Young Stellar Objects**

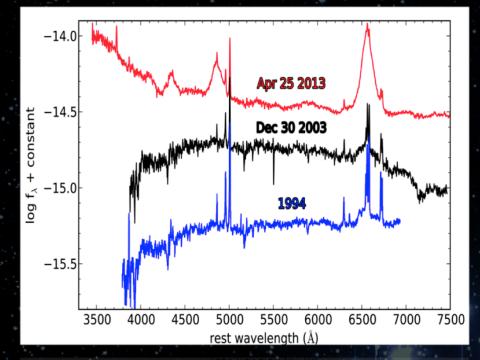


ASASSN-15qi Herczeg et al. (incl. Shappee) 2016

Ε

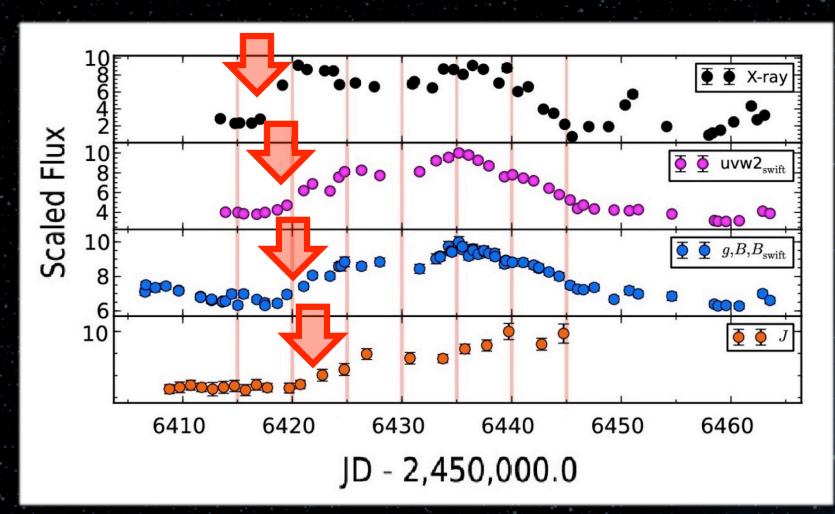
### "Changing look" AGN: NGC 2617

- ASAS-SN triggered on a 10% increase in flux from AGN + host
- Follow-up imaging showed AGN continued to brighten by 1.3 mag
- Follow-up spectroscopy showed that the AGN changed from a Seyfert type 1.8 to 1.0



Shappee et al. 2014

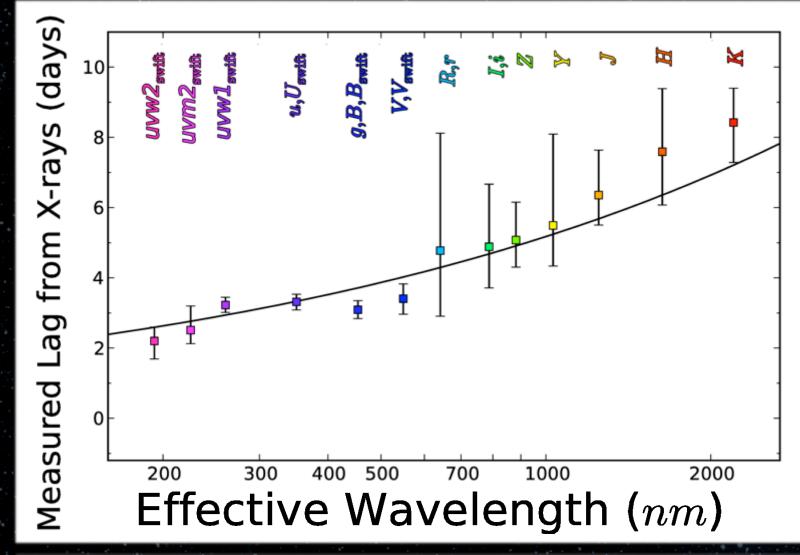
#### NGC 2617 X-ray–NIR light curves



450,000.0

Shappee et al. 2014

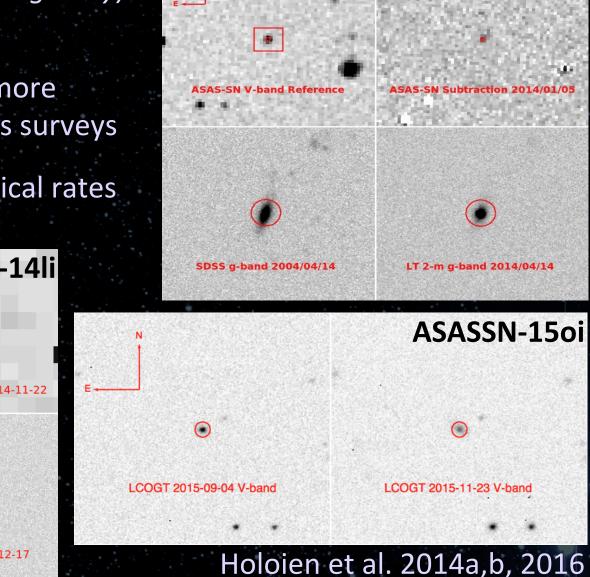
#### NGC 2617 Photometric Lags



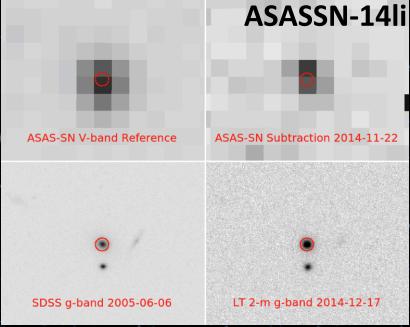
#### Shappee et al. 2014

### Tidal Disruption Events in ASAS SN

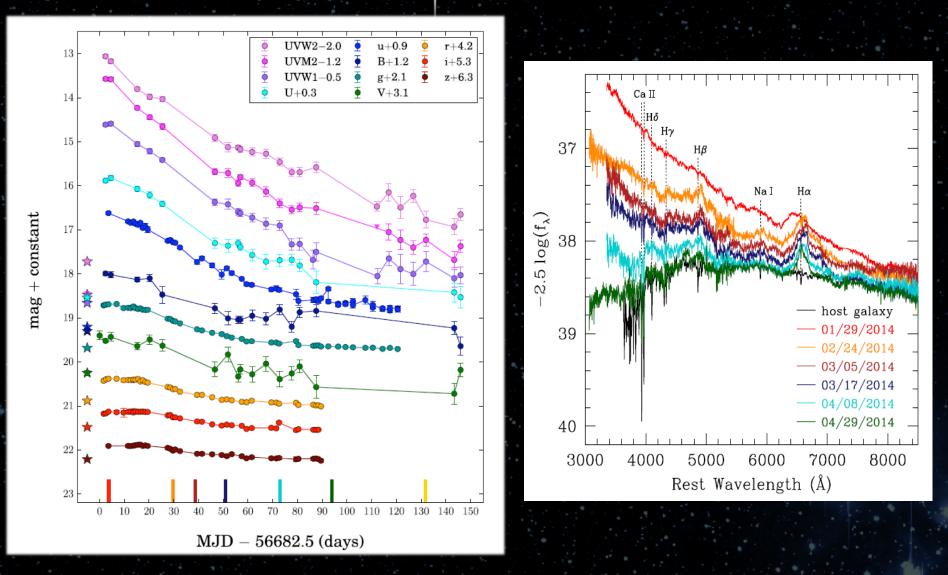
- 7 of the brightest and (arguably) best-studied
- ASAS-SN seems to be more complete than previous surveys
- Rates closer to theoretical rates



**ASASSN-14ae** 

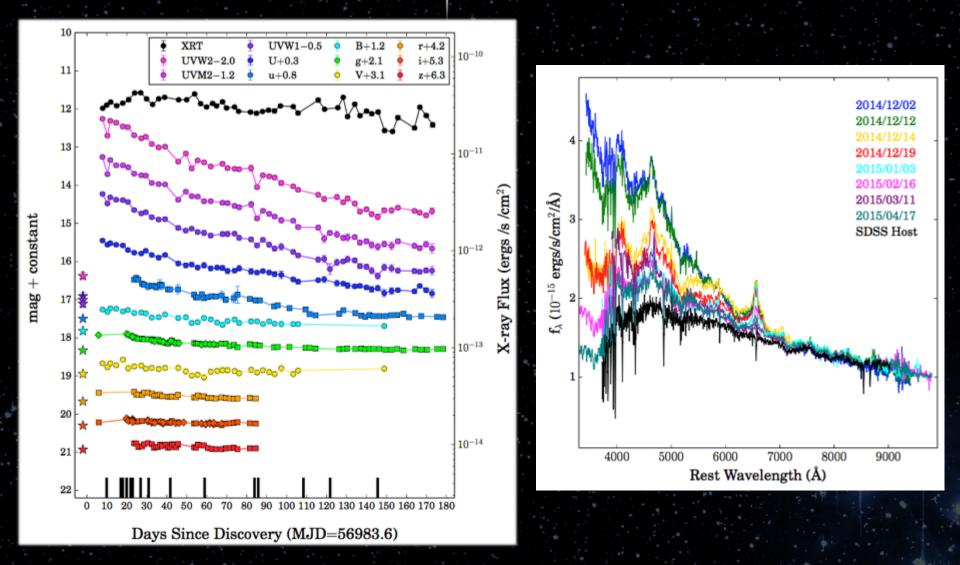






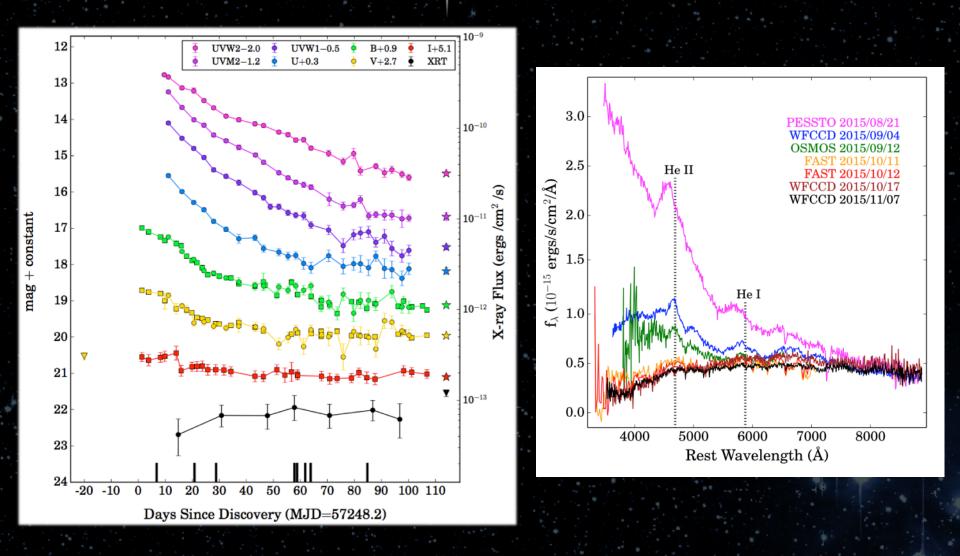
Holoien et al. (incl. Shappee) 2014b

# ASAS SN -14li



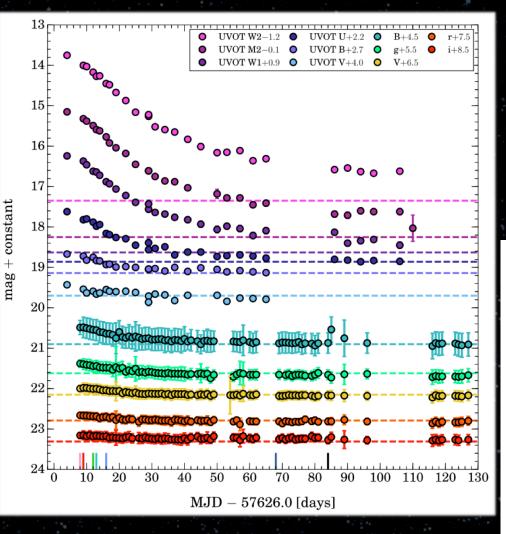
Holoien et al. (incl. Shappee) 2016

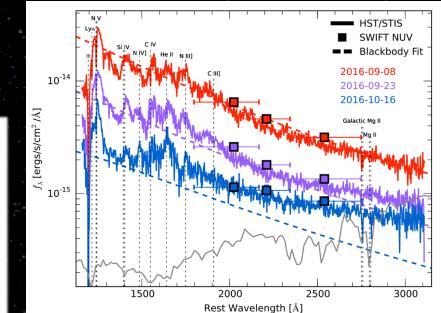
### ASAS SN-150i

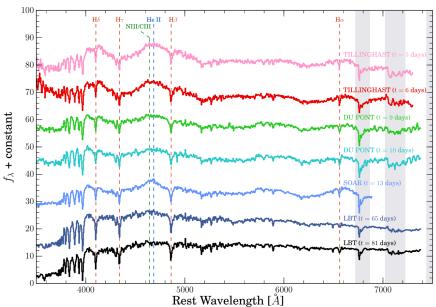


Holoien et al. (incl. Shappee) 2016b

#### iPTF 16fnl

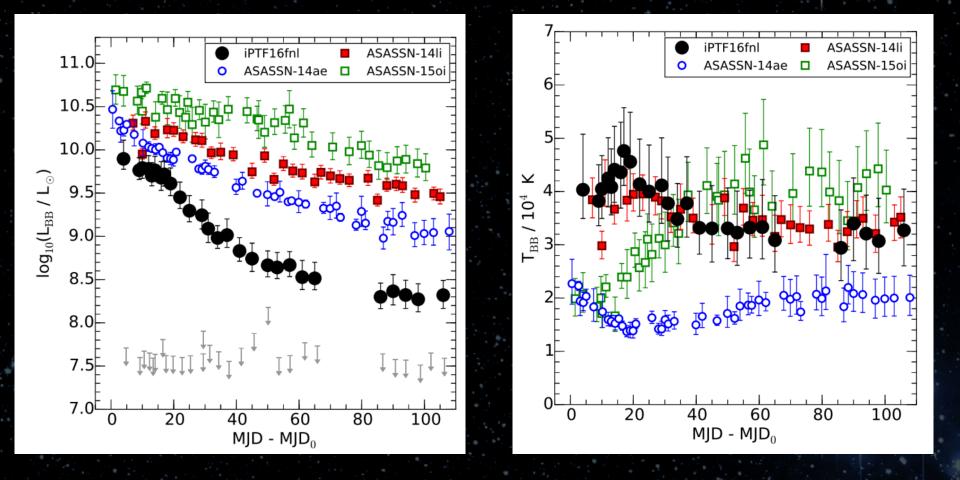






Brown et al. (incl. Shappee) 2017

#### Tidal Disruption Events in ASAS SN

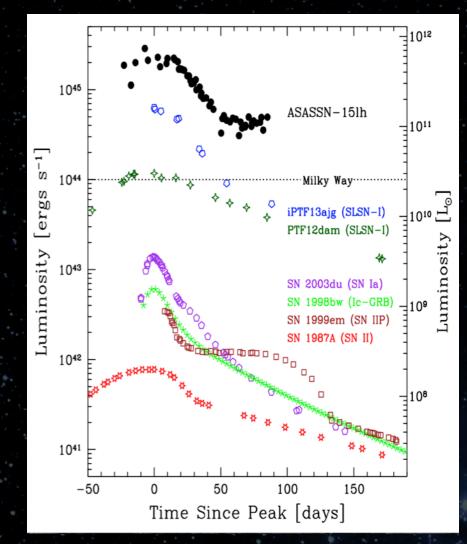


Brown et al. (incl. Shappee) 2017

### The most luminous supernova(?)

• Nuclear transient, massive host

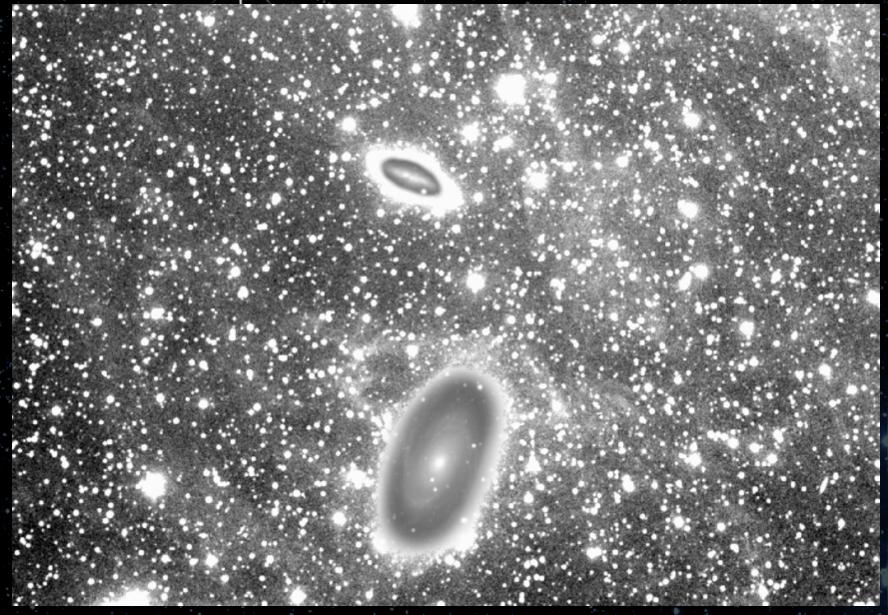
- The most luminous SN ever discovered? Dong, Shappee, Prieto et al. 2016
- Magnetar powered supernova? (most energy possible?) Metzger et al. 2015
- TDE like no other? Leloudas et al. 2016
- Extreme events challenge all models, unbiased survey



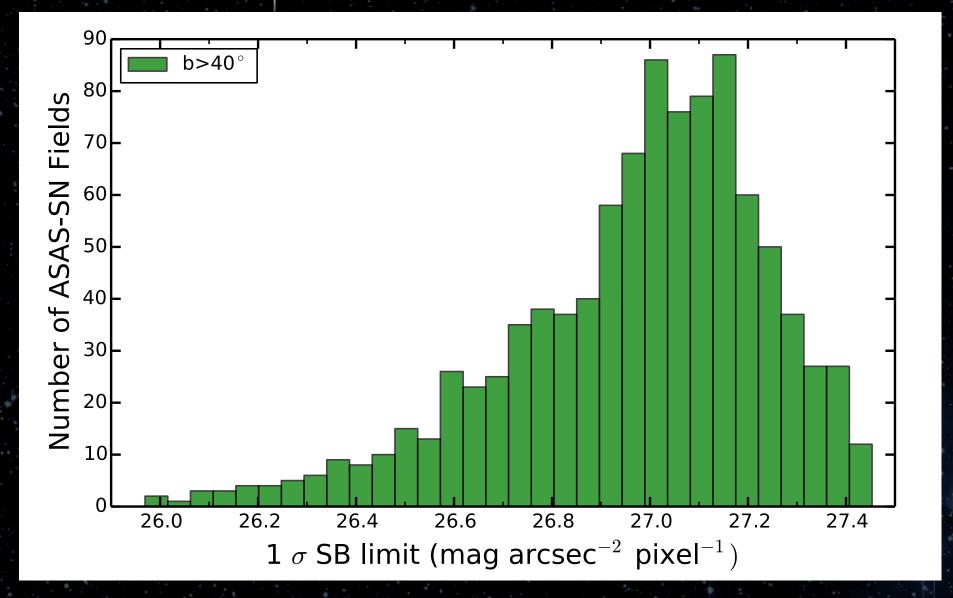
Dong, Shappee et al. 2016

# New science with ASAS SN !

# ASAS SN: Low Surface Brightness



### ASAS SN: Low Surface Brightness

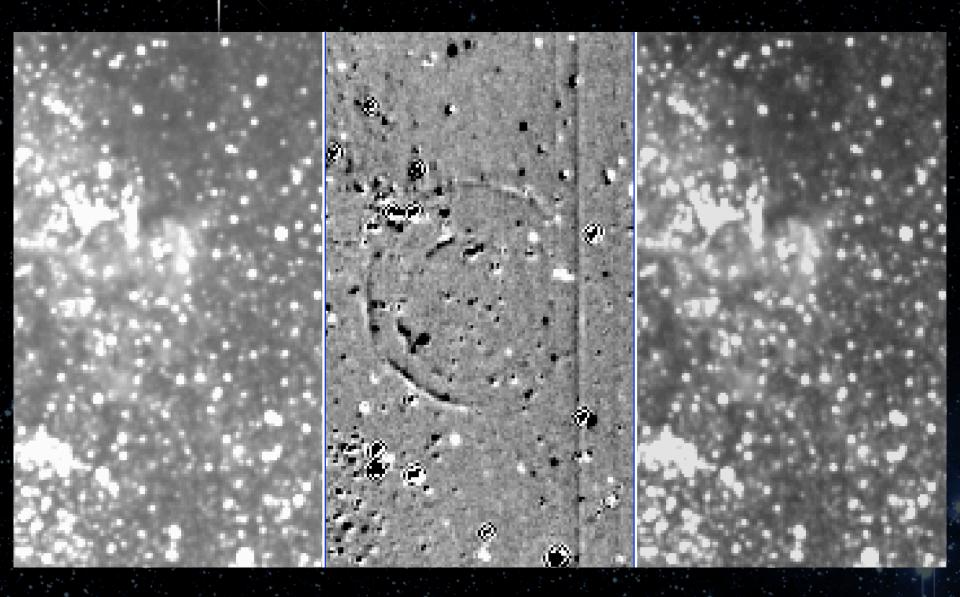


#### Light echoes, Time machines.

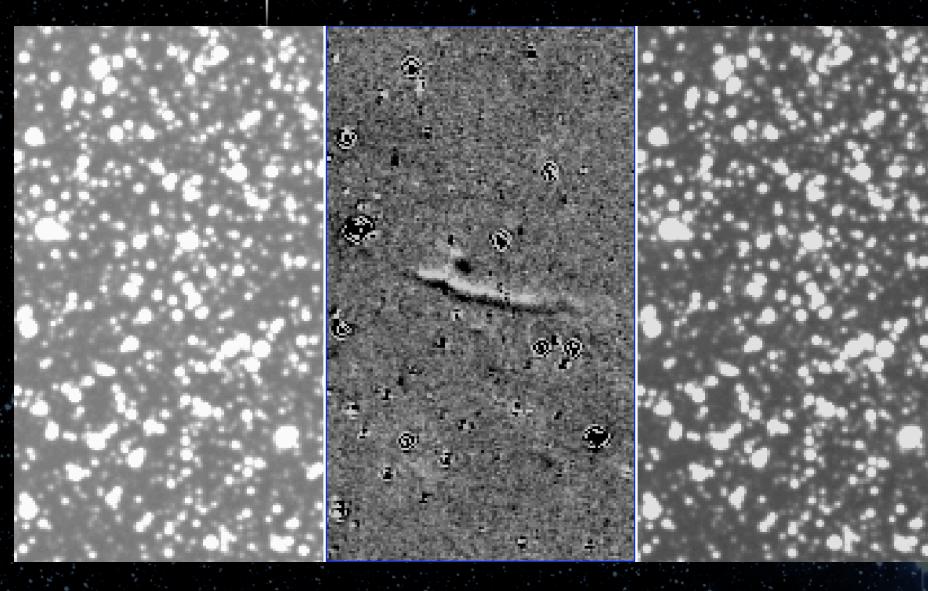
				Distance		Search Area
SN Name	RA	Dec	Date	(kpc)	Туре	(square deg)
Cas A	23:23	+48:58	1680	3.2	SN IIb	66
Tycho	00:25	+64:09	1572	2.3	Norm. SN la	287
Eta Car	10:45	-59:41	~1840	2.4	<b>Great Eruption</b>	36
SN 1181	02:05	+64:49	1181	2.6	?	2400
P Cygni	20:17	+38:02	1600	1.6	<b>Great Eruption</b>	3000
Crab Nebula	05:34	+22:01	1054	1.9	SN II?	3000
W49B	19:11	+09:06	1000	8	Core-Collapse?	113
Kepler	17:30	-21:29	1604	2.9	Pec. SN Ia?	140
SN 1006	15:02	-42:06	1006	2.2	Norm. SN Ia?	2300
RCW 86 (SN 185)	14:43	-62:28	0185	2.8	SN Ia/II ?	6000

Table adapted from Armin Rest Supernova Earth Echo P. Marenfeld and NOAO/AURA/NSF

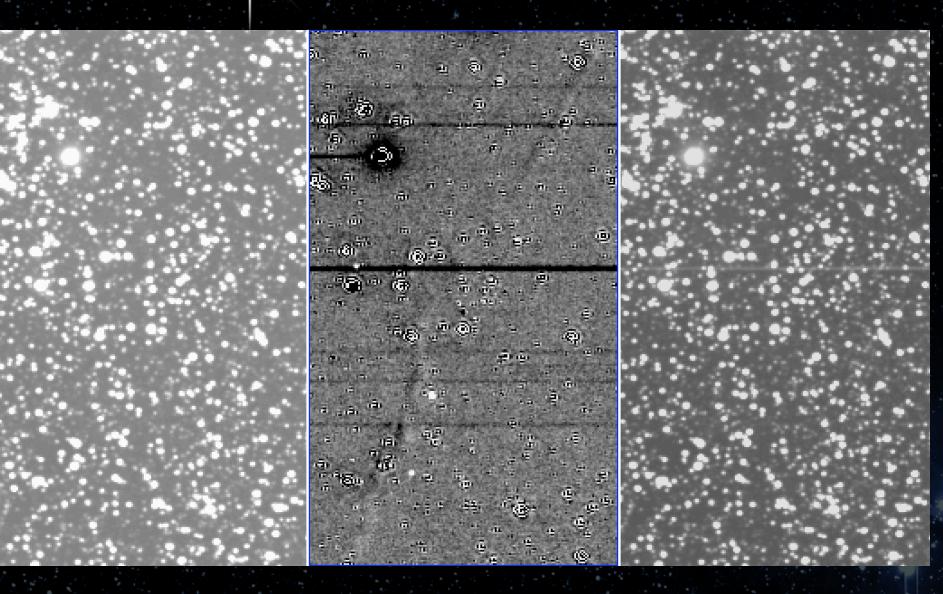
## ASAS SN: SN 1987A light echoes



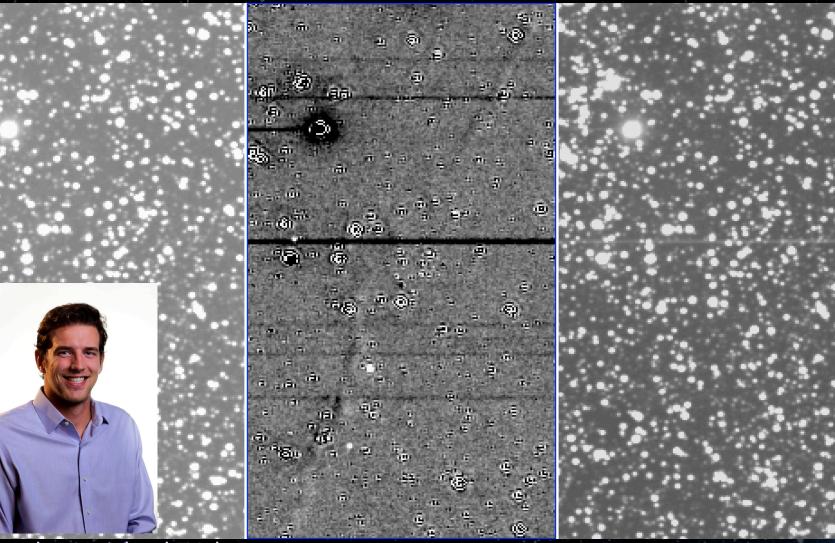
## ASAS SN: Tycho light echoes



### ASAS SN: Cas A light echoes

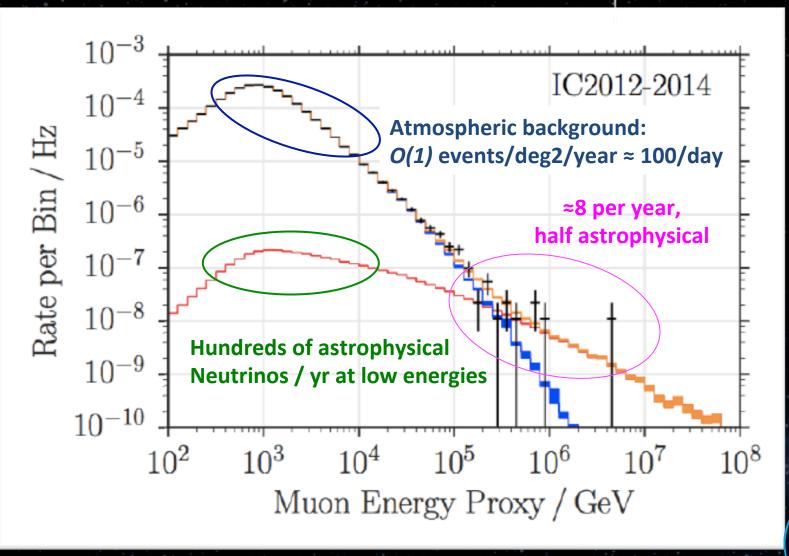


### ASAS SN: Cas A light echoes



Grad student Michael Tucker

# CECUBE + ASAS SN



Slides courtesy of Anna Franckowiak and Robert Stein





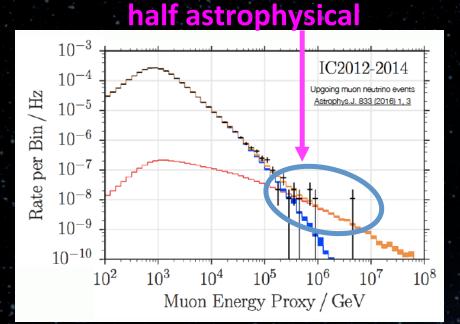
#### Two Approaches To ASAS **Correlate Neutrinos**



**ASAS-SN** observes

neutrino error

#### Roughly 8 per year,

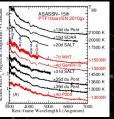




(how significant is detection?)

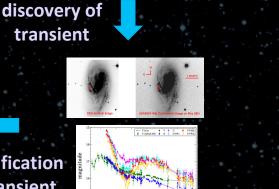
neutrino arrives





transient

identification of transient



Slide courtesy of Anna Franckowiak and Robert Stein

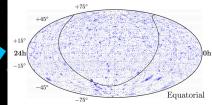
#### Two Approaches To ASAS SA Correlate Neutrinos



ASAS-SN scans entire sky

> ASAS-SN finds many transients

After ≈1year: Cross-correlate with neutrinos search for statistically significant excess



IceCube detects ≈100 neutrinos per day

 $10^{-3}$ IC2012-2014  $10^{-4}$ Upaoina muon neutrino events / Hz $10^{-5}$ Astrophys.J. 833 (2016) 1. 3 Rate per Bin  $10^{-6}$  $10^{-7}$  $10^{-8}$  $10^{-9}$  $10^{-10}$  $10^{3}$  $10^{5}$  $10^{2}$  $10^{4}$  $10^{6}$  $10^{7}$  $10^{8}$ Muon Energy Proxy / GeV

Hundreds of astrophysical Neutrinos per year at low energies

Slide courtesy of Anna Franckowiak and Robert Stein



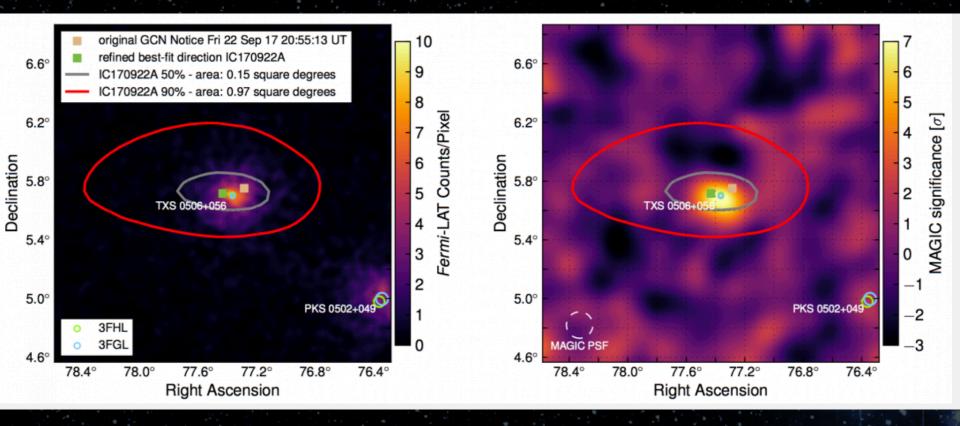
IceCube-170922A

G



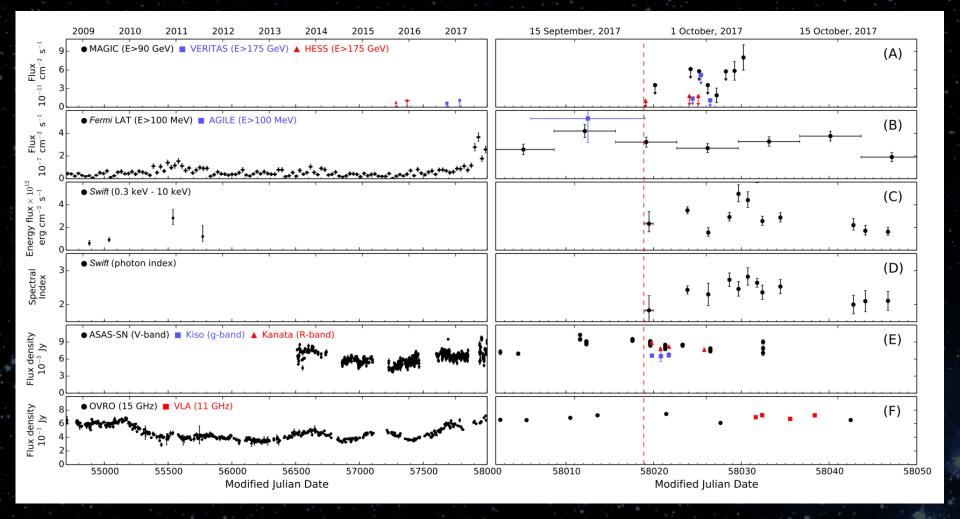
IceCube-170922A

ASAS





IceCube-170922A ASAS





### IceCube-170922A

e

Ve

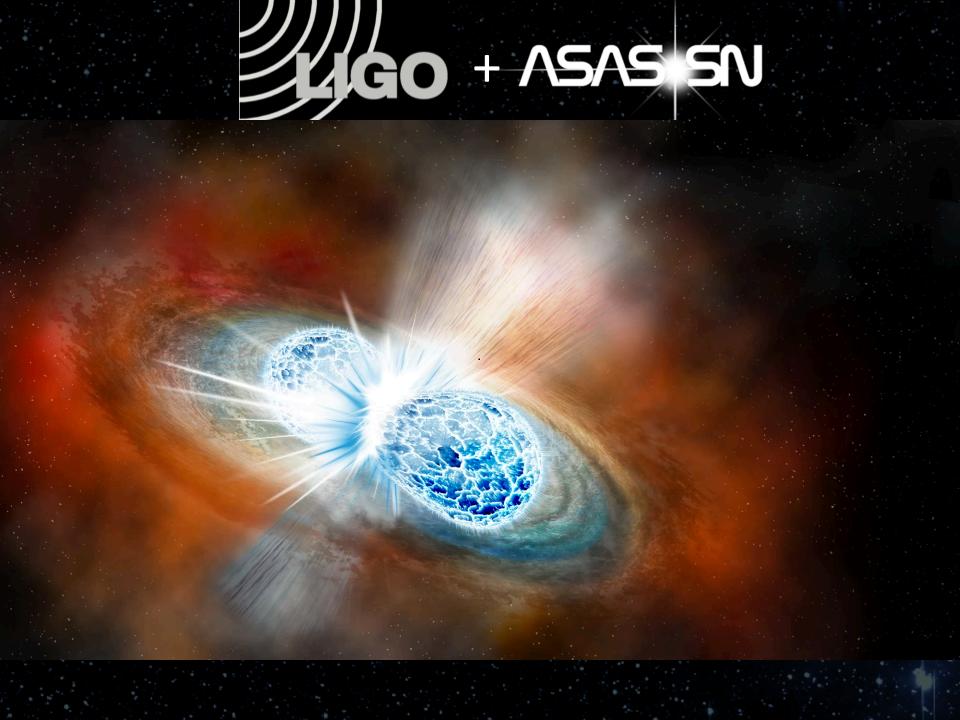
è

Vu

π

ASAS SN

Vu





#### Late-2019

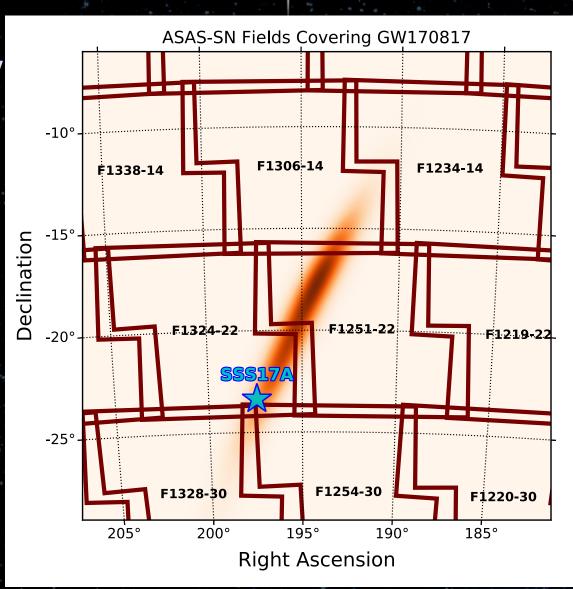








- ASAS-SN automatically triggers in ≈ 30 seconds
- GW170817 would have taken 2 fields from \*South Africa\*
  - ASAS-SN distribution around the globe is a major advantage.



#### High speed mode of Tomo-e Gozen: Application for Optical Pulsars

May. 3-4, A.D.2019 Carnegie Observatories

ICHIKI Makoto (2<sup>nd</sup> year doctor course student, UTokyo, Japan)



#### Contents

- •About Tomo-e Gozen Camera
- About Optical Pulsars
- The result of test obs. for Crab pulsar
- Optical Pulsar Survey plan by Tomo-e
- •Simultaneous obs. with Radio/X-ray

#### Tomo-e Gozen Camera

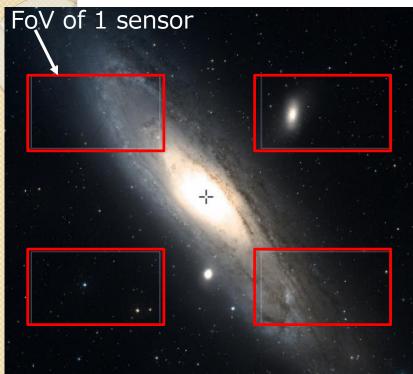
#### Tomo-e Gozen Camera Extremely wide field CMOS camera



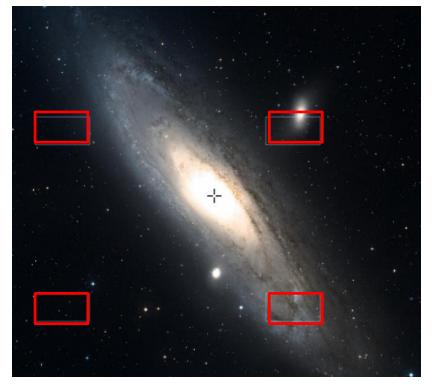
Telescope	Kiso Schmidt (aperture105cm, seeing~4'')		
Filed of view	22 deg <sup>2</sup> in $\phi$ 9 deg		
Sensor	<u>CMOS</u> (1k x 2k) x 84		
Frame rate	2 frame / sec (0.5sec/frame)		
Read out time	<0.5sec		
Wavelength	optical		

#### Full frame mode of Tomo-e can see ≳seconds time scale events

# Partial mode (high speed mode) of Tomo-eFull frame modePartial frame mode



2000 \* 1200 pix<sup>2</sup> each -> 0.5 sec cadence

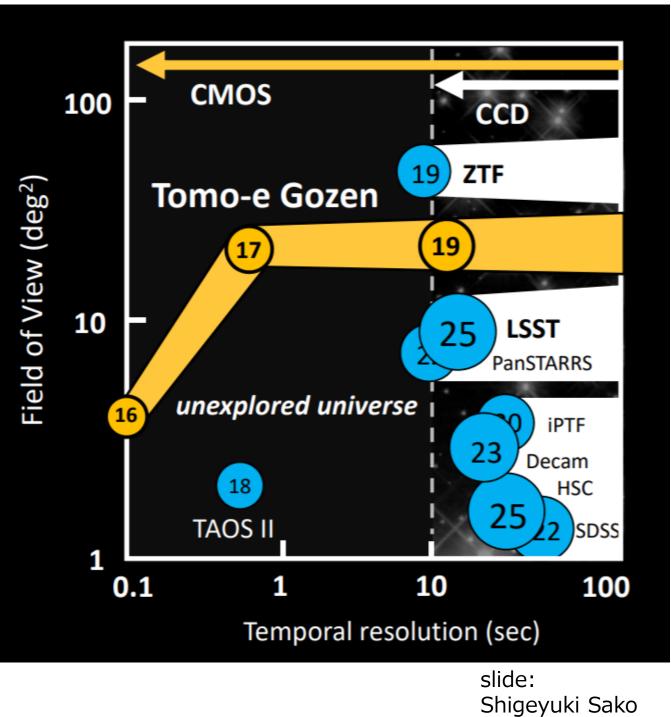


#### 1000 \* 500 pix<sup>2</sup> each -> <u>0.12 sec cadence</u>

Partial mode of Tomo-e can see sub-seconds time scale events

# Survey power for transients

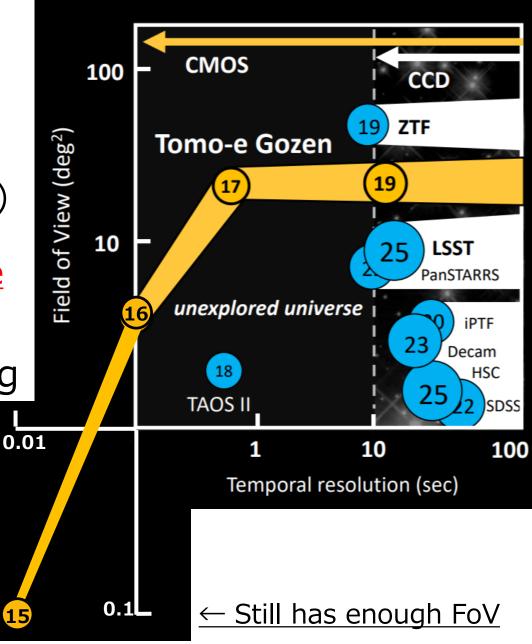
Limiting magnitudes are showed in the circles



# Survey power for transients

280 \* 24 pix<sup>2</sup> (FoV = 0.05 deg<sup>2</sup>) -> <u>5.2 msec cadence</u>

Transient or Pulsating Objects that have ~10msec time scale can be searched by Tomo-e



# About Pulsars

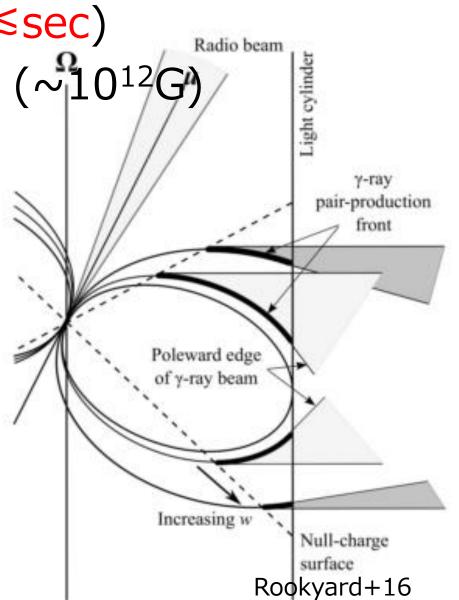
What is pulsar?

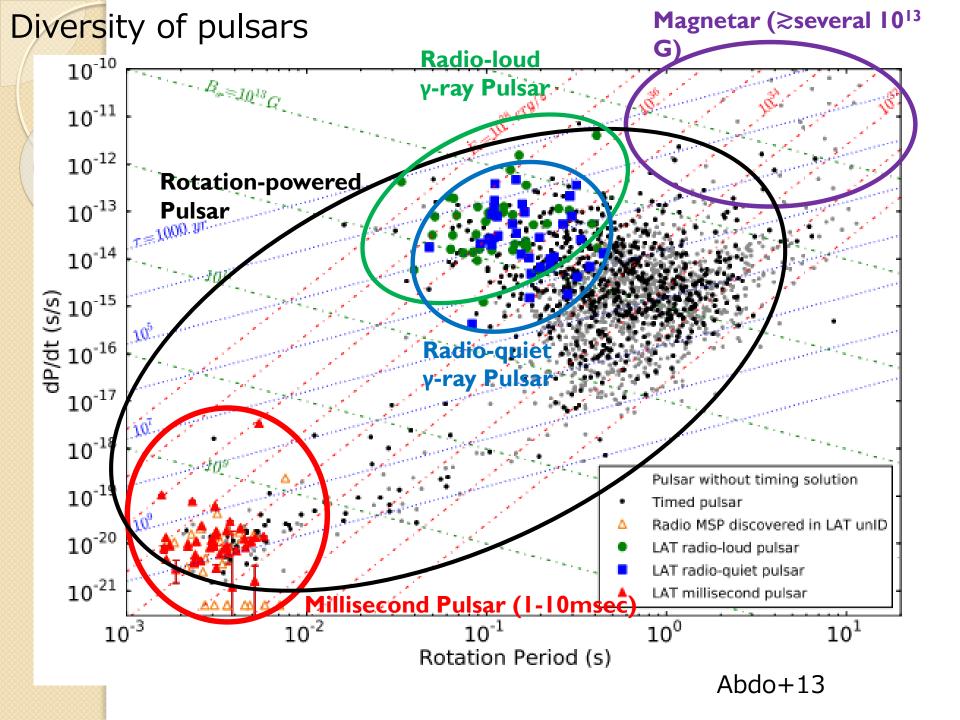
Pulsed emission (due to beaming effect)

- Fast Rotation (Period ≤ sec)
   Strong magnetic field (~10<sup>12</sup>G)
- •Neutron Star



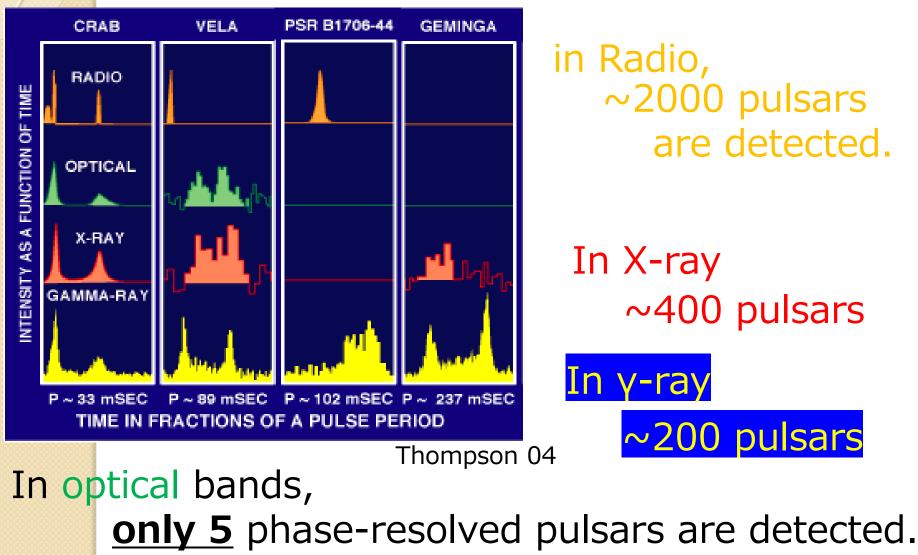
Neutron star… Radius ~ 10km Mass ≥ 1.4 solar mass Only visible Nuclear matter





# Current status of optical observations for Pulsars

### Diversity of light curve in a period



All optical pulsars have been detected only by follow-up observation for Radio/X·γ-ray survey.

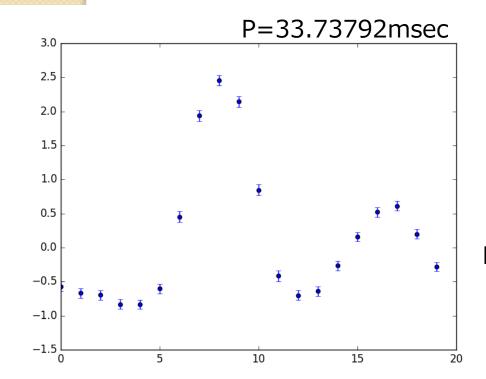
# Pulsar observation by Tomo-e

# Test Observation for Crab Pulsar

# Test observation for Crab pulsar

↓ Mean image for 50000 frames (322 sec) Oct. 2017 by Tomo-e Q0

"Mean image of Peak 10000 frames" – "Off-peak 40000 frames"



frames	Pulses	SD	S/N
100	$\sim 20$	0.73	8
300	$\sim 70$	0.46	13
1000	$\sim 200$	0.27	22
3000	$\sim 700$	0.19	30
10000	$\sim 2000$	0.13	50

Relation between number of frames and S/N

Sufficient S/N for pulsar survey

# Optical pulsar survey plan by Tomo-e Gozen

# Survey Parameters

Conditions

- •FoV of Tomo-e Gozen (180Hz):  $0.04 deg^2$
- •Time for Telescope moving:

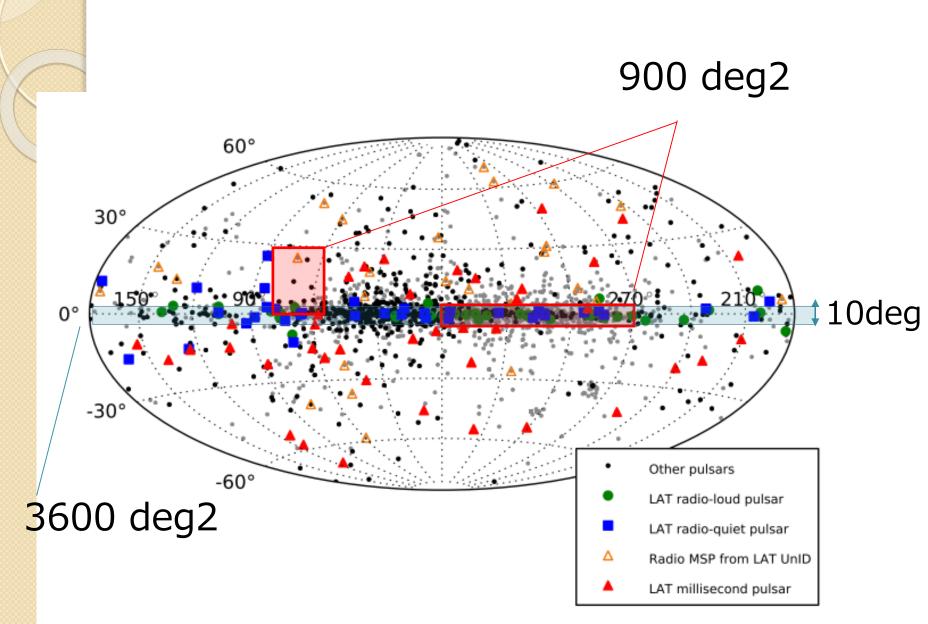
6 sec

Parameters

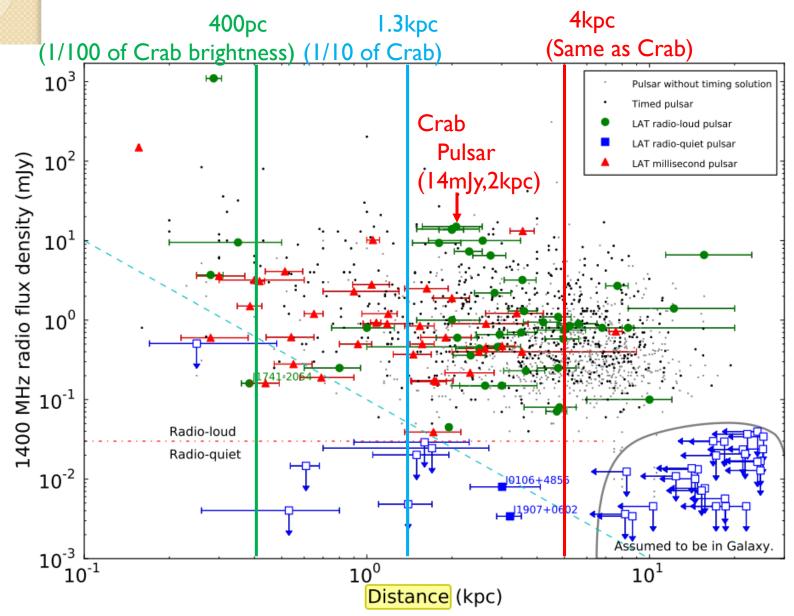
- •Total Exposure time
- Total Observation time

e.g. Observation of 6 sec/FoV for 10 nights gives 950  $\frac{deg^2}{deg^2}$ ( x 4 season = 3800  $\frac{deg^2}{deg^2}$ )

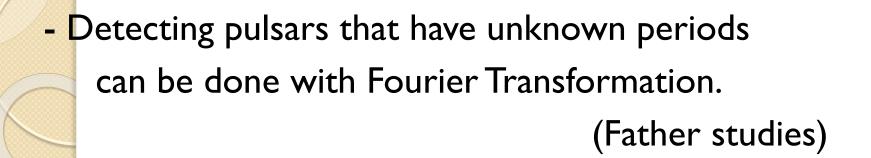
# Survey Area

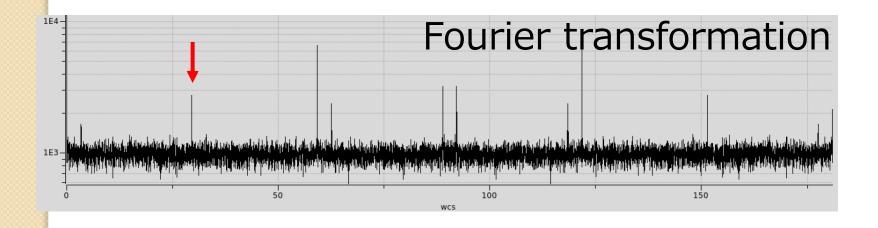


### Survey depth (for 6 sec /FoV)









# Simultaneous observations with Radio and X-ray

- In Crab Pulsar, it is reported that its optical pulses  $are \sim 3\%$  enhanced when Giant Radio Pulses occur.

Simultaneous observations have been done by Tomo-e with Radio (Kashima NICT) and X-ray (NICER) 2018/03/13-14 2018/04/07 2018/12/26-30 Now under analysis



One of the good points of Tomo-e for this obs. is that its wide field allows us to use reference stars for comparing different obs. periods.

# Thank you!

# Optical Fast Observations with the Wide-Field CMOS Sensor Camera: Tomo-e Gozen

### Noriaki Arima (Univ. of Tokyo)

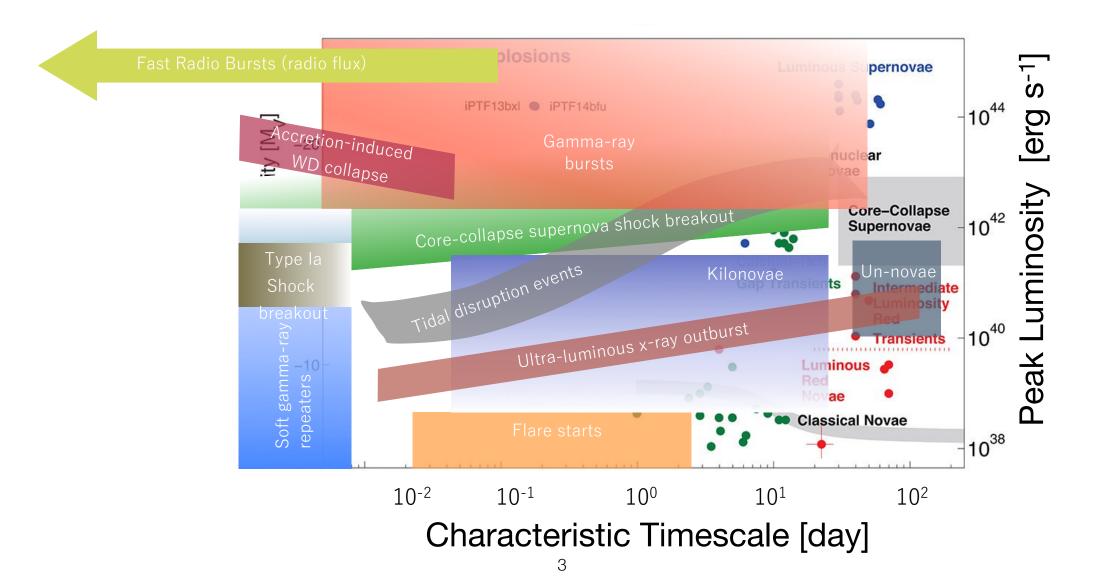
Shigeyuki Sako(PI), Ryou Ohsawa, Hidenori Takahashi, Yuto Kojima, Tomoki Morokuma, Mamoru Doi, et al.

# Contents

- Introduction: Scientific Background
- Tomo-e Gozen
  - Kiso Observatory & Telescope
  - The Performances
- Transient Survey w/ Tomo-e Gozen
- Summary

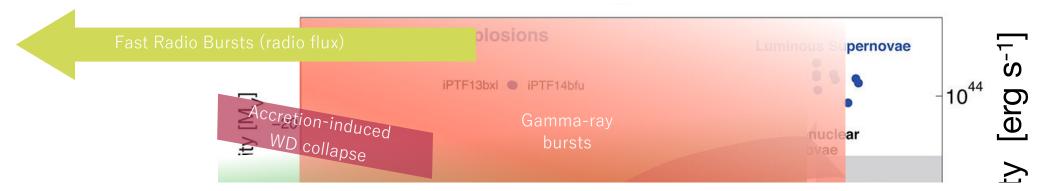
# **Time Domain Astronomy**

### The phase space of optical transients

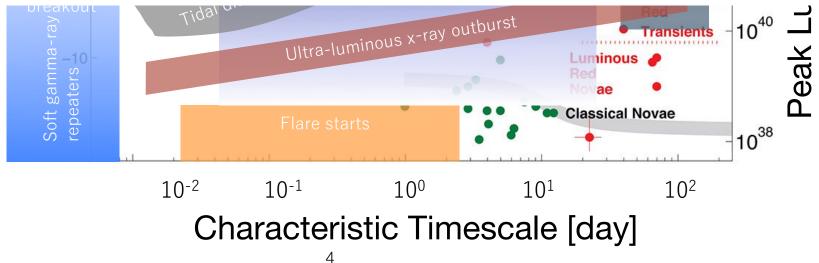


# **Time Domain Astronomy**

### The phase space of optical transients

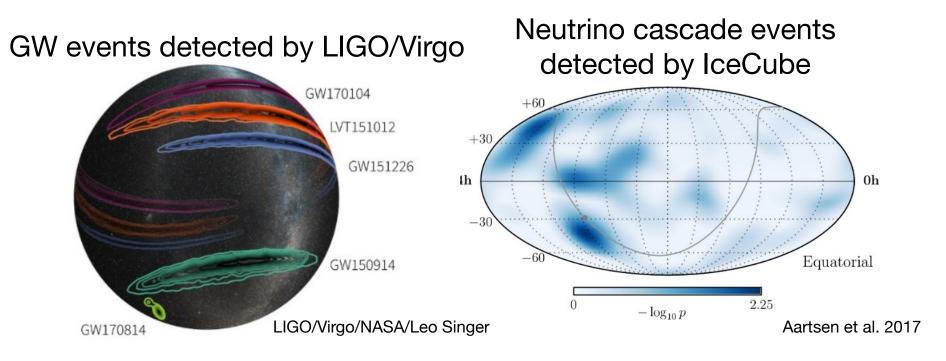


# The Universe with **HOURS scale** is **less surveyed**. The Universe with **SECONDS scale** is **still unknown**.



# Multi-messenger astronomy

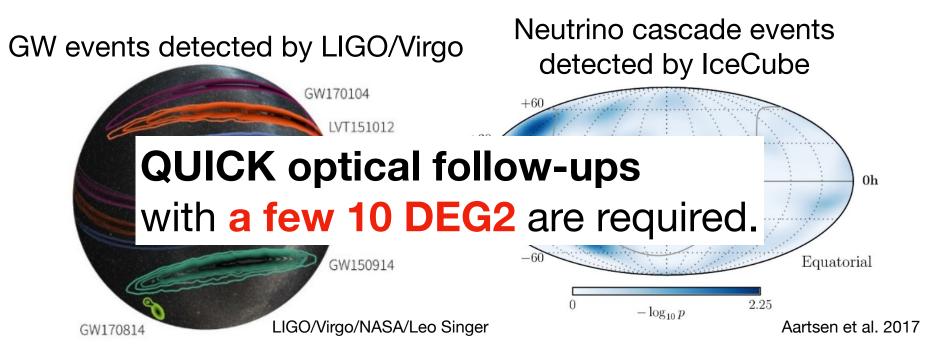
- Gravitational waves were detected from a black hole-black hole merger in 2015.
- The new astronomy with EM and non-EM radiations has begun.



In both case, typical localization error is 10 – 100 deg2

# Multi-messenger astronomy

- Gravitational waves were detected from a black hole-black hole merger in 2015.
- The new astronomy with EM and non-EM radiations has begun.



In both case, typical localization error is 10 – 100 deg2



The Tomo-e Gozen

Image: TNM Image Archives

# Tomo-e Gozen Telescope

### http://www.ioa.s.u-tokyo.ac.jp/kisohp/top\_e.htm

- 1m Kiso Schmidt telescope
  - Operated by U. Tokyo since 1974
  - 9 deg diameter FOV



137.6283,+35.7940 (EL=1130 m)





# Camera

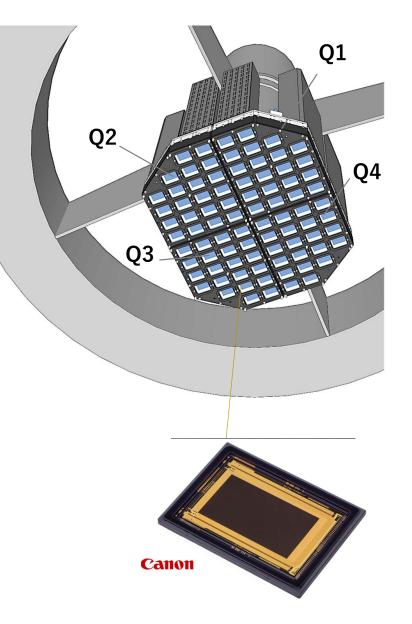
### http://www.ioa.s.u-tokyo.ac.jp/tomoe/about.html



Sako et al. 2018, SPIE Kojima et al. 2018, SPIE Osawa et al. 2016, SPIE

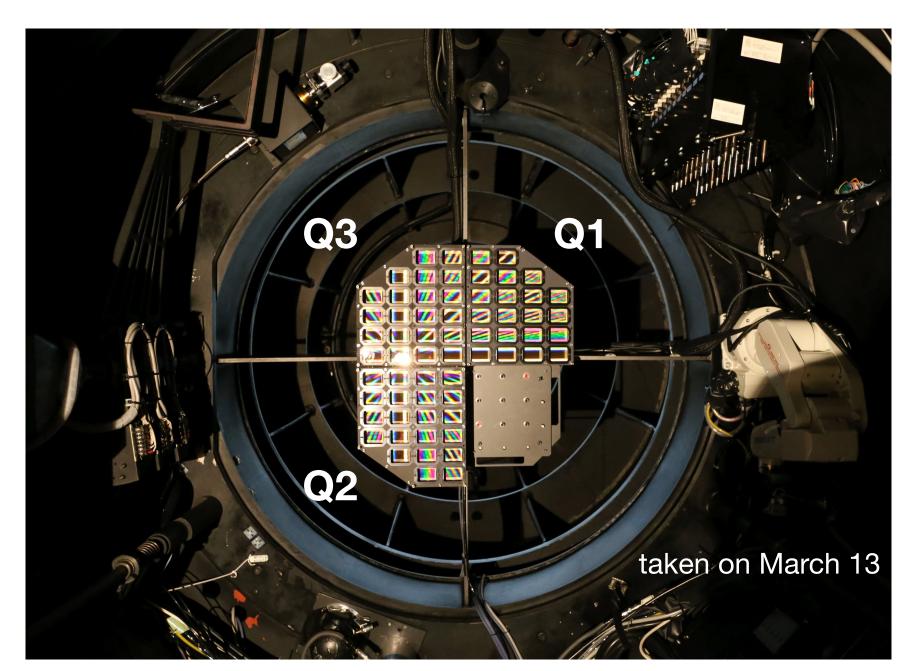
# the first wide-field CMOS camera The Tomo-e Gozen

- FoV of 20 deg<sup>2</sup> in  $\phi$  9 deg
- 84 chips of CMOS, 1k x 2k pixels
- Consecutive frames in 2 fps (max)
- Big movie data of 30 TB/night (max)



Slide courtesy of Shigeyuki Sako

# Q1+Q2+Q3 on focal plane



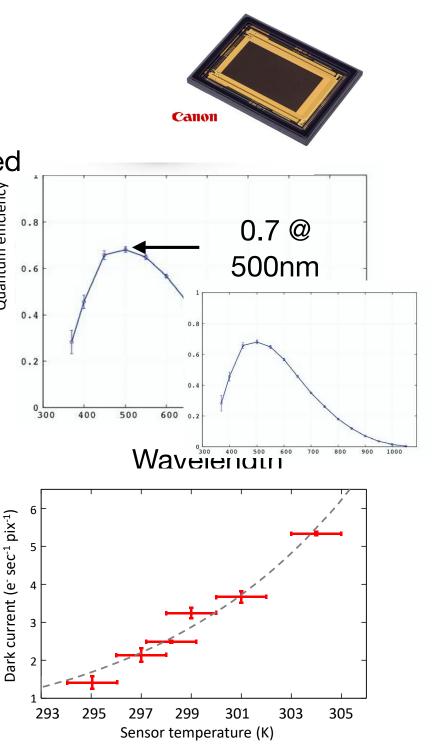
# Sensor

- Large pixel CMOS sensor by Cannon
  - 2000 x 1128 pixels, front side illuminated
  - 19 um/pix (= 1.198 arcsec/pix)

• Sensitive at 370-730 nm

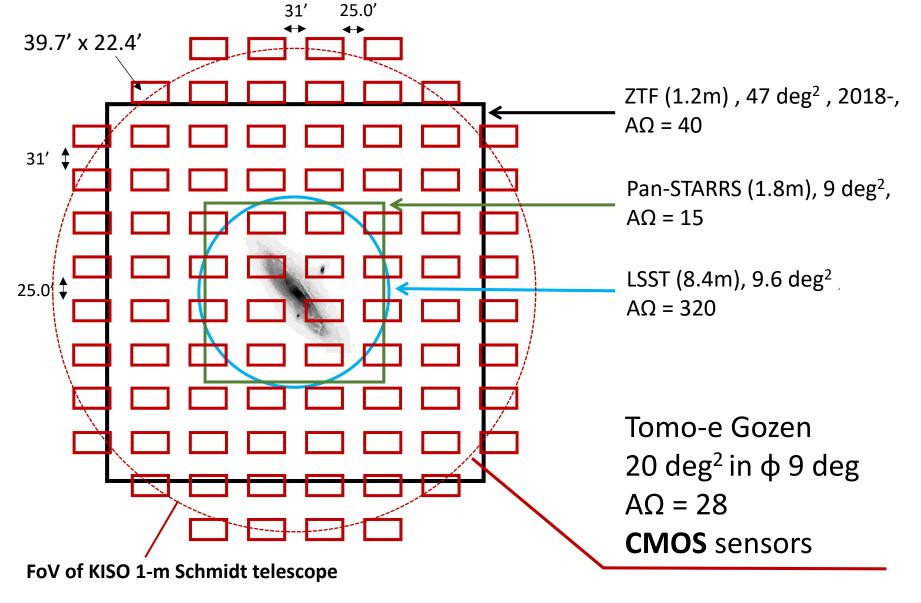
- Readout noise: 2.0 e-
- Dark current: 6e<sup>-</sup> sec<sup>-1</sup> @ 305K (sky 50 e<sup>-</sup> sec<sup>-1</sup> pix<sup>-1</sup> at Kiso)





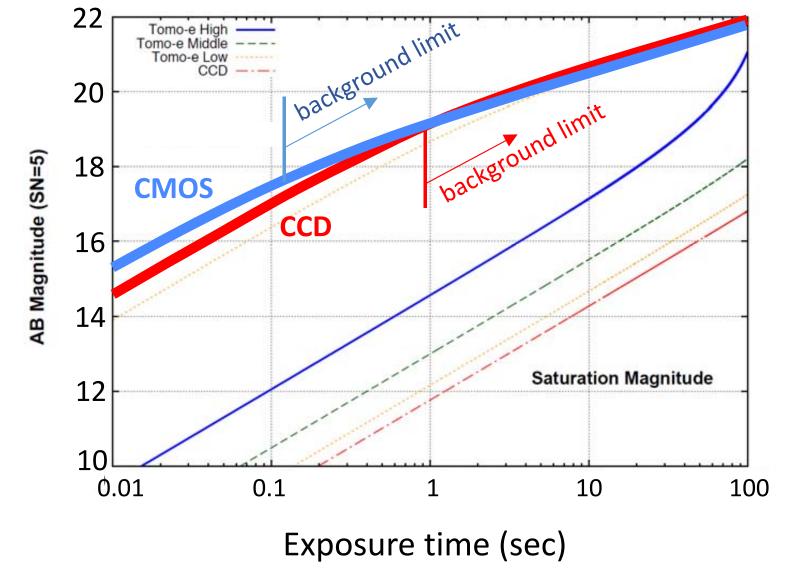
Quantum efficiency

### Tomo-e Gozen Field of view



Slide courtesy of Shigeyuki Sako

Tomo-e Gozen
Limiting magnitudes



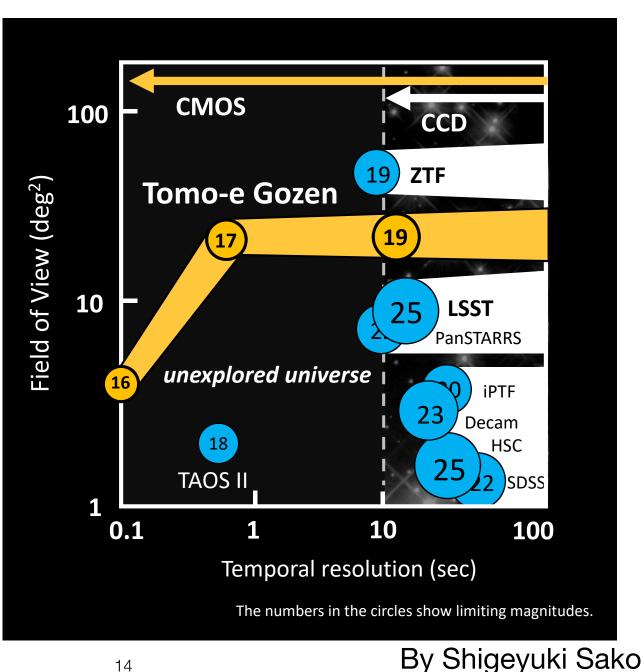
Kojima, Sako, Ohsawa et al. 2018, SPIE

Slide courtesy of Shigeyuki Sako

### Tomo-e Gozen **Transient sky in second timescale**

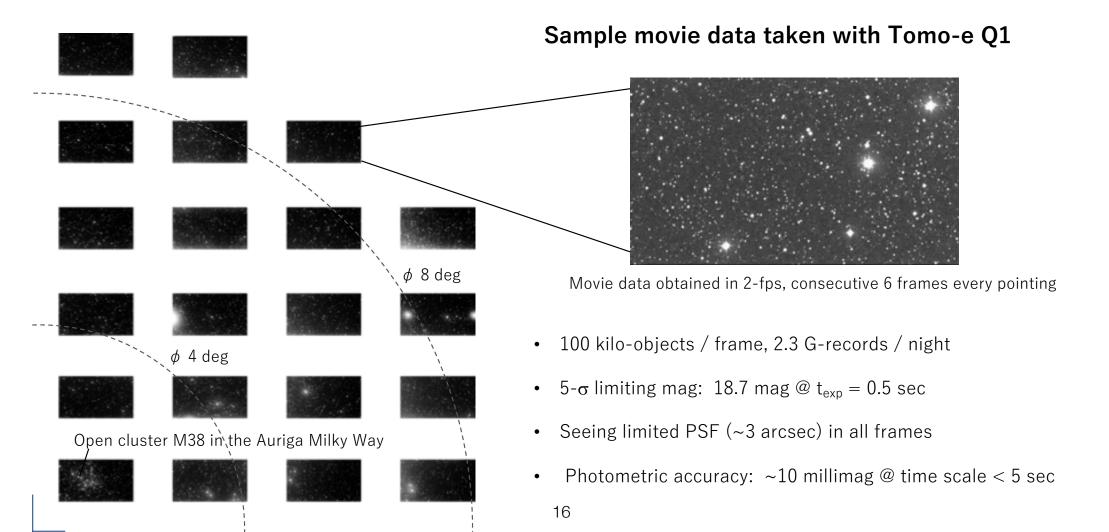
**Default observing mode:** imaging with 2 Hz (2fps)

- ~17 mag in 0.5 sec
- ~30 TB/night

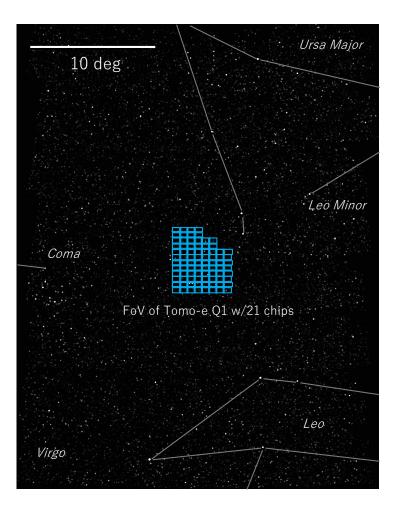


# Transient Survey w/ Tomo-e Gozen

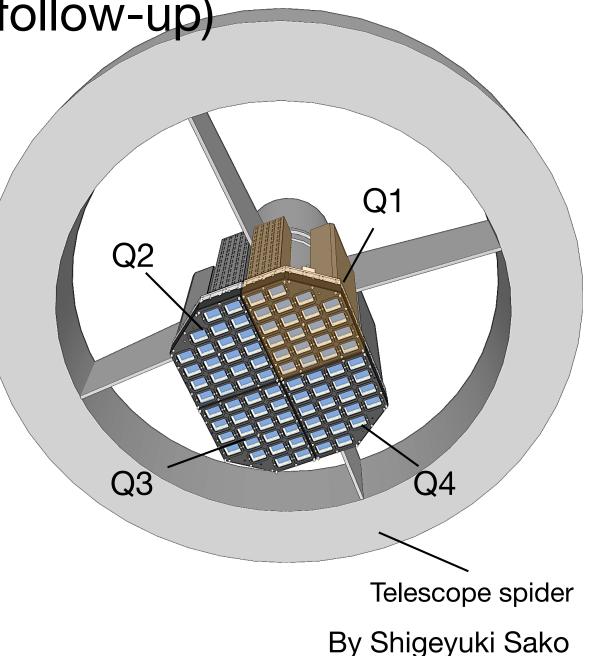
## Transient Survey w/ Tomo-e Gozen **Data acquisition started from Feb. 2018 with Tomo-e Q1 (21 sensors)**



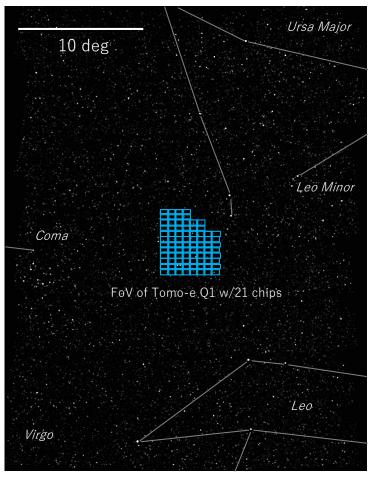
## Transient Survey w/ Tomo-e Gozen Very wide-field transient survey (Supernova, GW follow-up)



produced from Tomo-e Gozen Q1

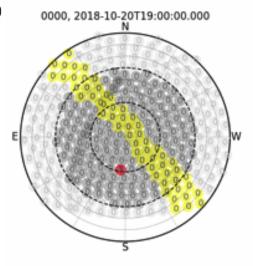


### Transient Survey w/ Tomo-e Gozen Very wide-field transient survey (Supernova, GW follow-up)



#### Q1 tests for the Northern sky survey

- Survey area: ٠
  - $Elv > 40 \deg \rightarrow 7,000 \deg^2 in 84 chips$ Survey pattern: 2 x 2 dithering
- Exposure: on-source 6 sec/pos (5-s 20 mag) ٠  $\rightarrow$  0.5sec x 12 frames/pos
- Beam switching: ~ 8 sec
- Elapsed time: 2 hours ٠



#### Estimated new detections

- Supernovae 1 - 2 events/night
- Other transients > 100 events/night
  - Meteors > 1.000 events/night
- Artificial objects > 1,000 events/night

produced from Tomo-e Gozen Q1

Simulation of northern sky survey

- Each circle: FoV with Φ9 deg
- Yellow: Milky way

### produced from Tomo-e Gozen Q1

By Shigeyuki Sako

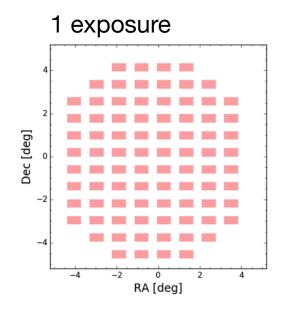
# Northern sky transient survey

### PI: Tomoki Morokuma

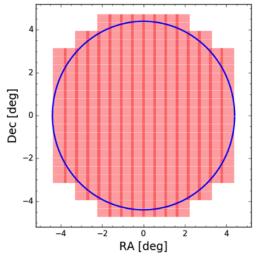
- Survey plan: 7000 deg<sup>2</sup> 2hr cadence 18 mag
  - 1 "visit" = 60 deg<sup>2</sup> in 1 min
    - 12 x 0.5 sec = 6 sec (~18 mag depth)
    - 2 x 2 dithering (to fill the gap)
  - 2 hr cadence (= 120 visits)
     => ~7000 deg<sup>2</sup> in total (elevation > 40 deg)
  - No filter (effectively g + r)
  - Keep detection information of 2 Hz images

### • Schedule

- 2018 November (Q1, FOV 5 deg<sup>2</sup>)
- 2019 April (Q1-4, FOV 20 deg<sup>2</sup>)



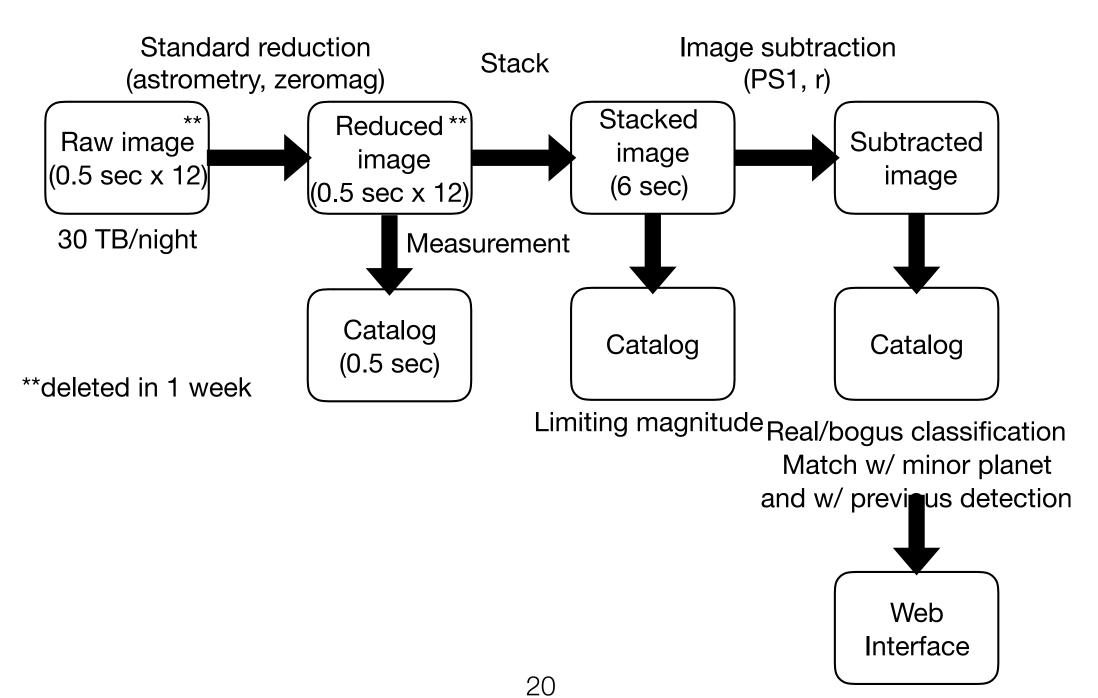




By Tomoki Morokuma

#### Transient Survey w/ Tomo-e Gozen

#### **Data flow**



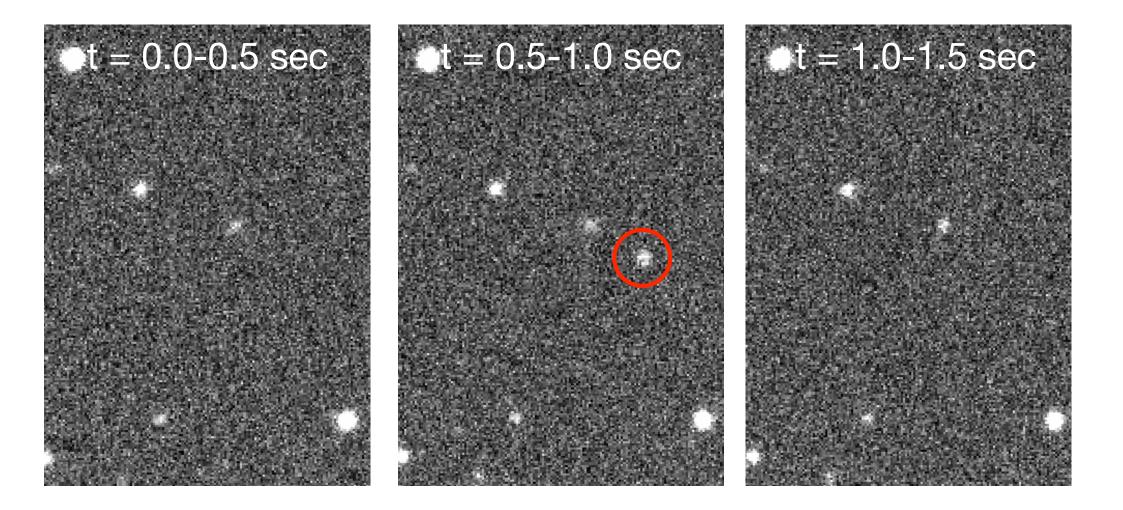
#### Transient Survey w/ Tomo-e Gozen

#### Transient detection in the test run

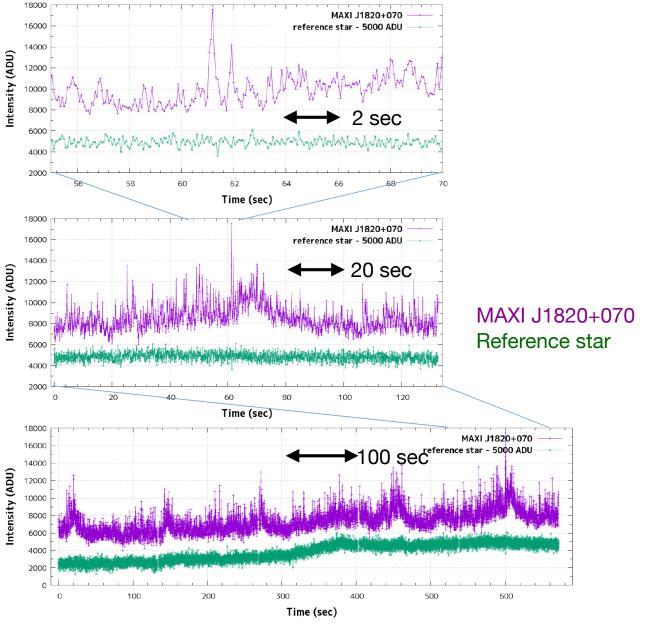
#### = AT 2018leh (2018-12-31) = ZTF18adbmrug (2018-12-30)

Tomo-e transi	ent server List	Object /	Account	Log	out					
	previous									
		SDSS sient ID: 220736 Variable_id: 1021301 mber of detections: 3 (paramcand)						PS1         ref         cr         sub           gri 3-color         58496.5133 17.74 +- 0.07		
		2019-01-11								
	Tags     Click a tag for removal     Insert tags									
	No tag assigned.	Rapid	Young?	SN?	AGN AGN?	MP? Variable?		gus or	submit	
	Ra, Dec (Decimal)	Ra, Dec			Dete	ctor ID	x,y			
	61.26379 , 25.26215	04:05:03.31, +25:15:43		:43.8	134		0.00 , 0.00 0.00 , 0.00			
	Relavant links	SDSS	PS1	TNS	MPC	hecker	Visibility (local	site: 137.6283 35.79	42 1130 +9)	
	fits files	Ref	Sub		2	21				

#### Very rapid transient in 2Hz imaging mode



#### Rapid variability of X-ray transient (MAXI J1820+070)



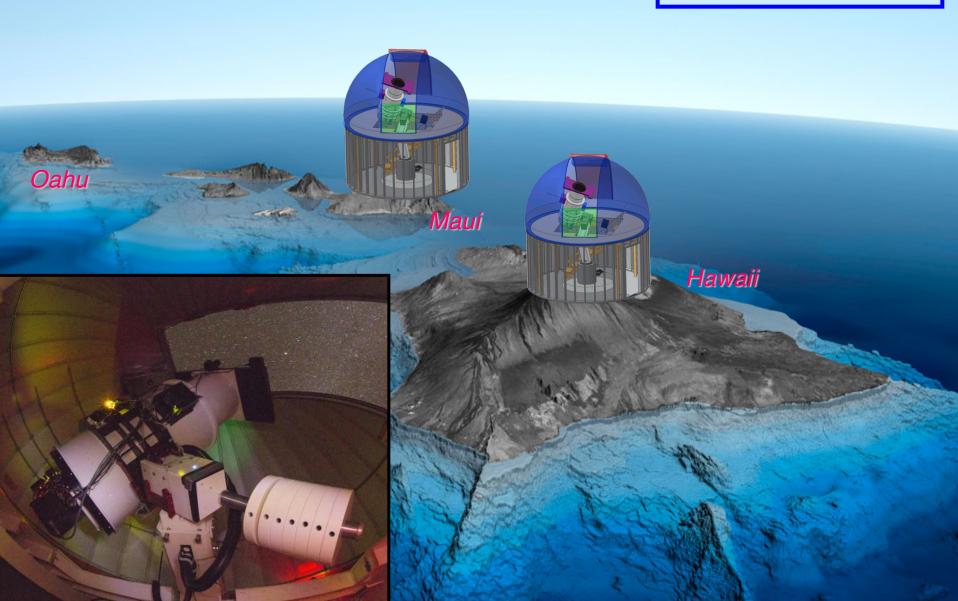
Sako et al. 2018, ATel, 11426

http://www.ioa.s.u-tokyo.ac.jp/tomoe/MAXIJ1820+070/MAXIJ1820+070.html

### **Tomo-e Gozen: summary**

- Instrument (PI: Shigeyuki Sako, U. Tokyo)
  - 1m Kiso Schmidt telescope
  - 84 CMOS chips (1k x 2k)
  - 20 deg<sup>2</sup> FOV
  - Imaging with 2 Hz (2 fps)
  - ~17 mag in 0.5 sec exposure
  - 30 TB/night (raw data are deleted in 1 week)
- Survey (PI: Tomoki Morokuma, U. Tokyo)
  - 7000 deg<sup>2</sup> 2 hr cadence 18 mag (6 sec exposure)
  - No filter
  - 2018 November (FOV 5 deg<sup>2</sup>), 2019 April (FOV 20 deg<sup>2</sup>)



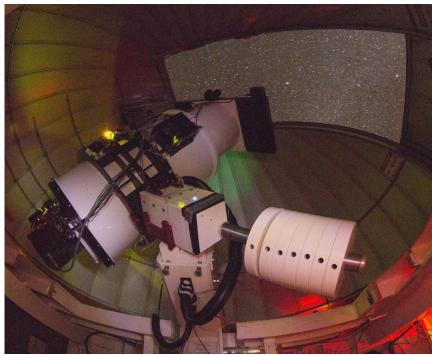


# Why Survey the Sky?

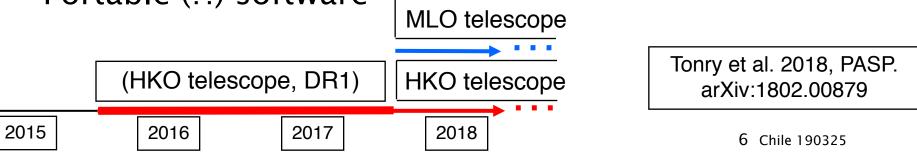
- Because we can.
  - In the past 10 years silicon technology capacity and capability has exceeded the information content available from the sky! OMG!
- Unknown unknowns.
  - Pure discovery of weird phenomena that enrich our appreciation of what goes on in nature. E.g. QSOs, gravitational lensing, SS433, exoplanets, LIGO optical counterparts, etc.
  - Do stars ever disappear? What flashes in the sky at m~8?
- Known unknowns.
  - Greater understanding of rare things. E.g. GRBs, weird- hyper- kilonovae, gravitational lenses, etc.
- Known knowns (that are useful).
  - Standard candles such as RR Lyrae, Cepheid, M giants, SNIa for mapping dust, cosmology, etc.

### ATLAS in a Nutshell

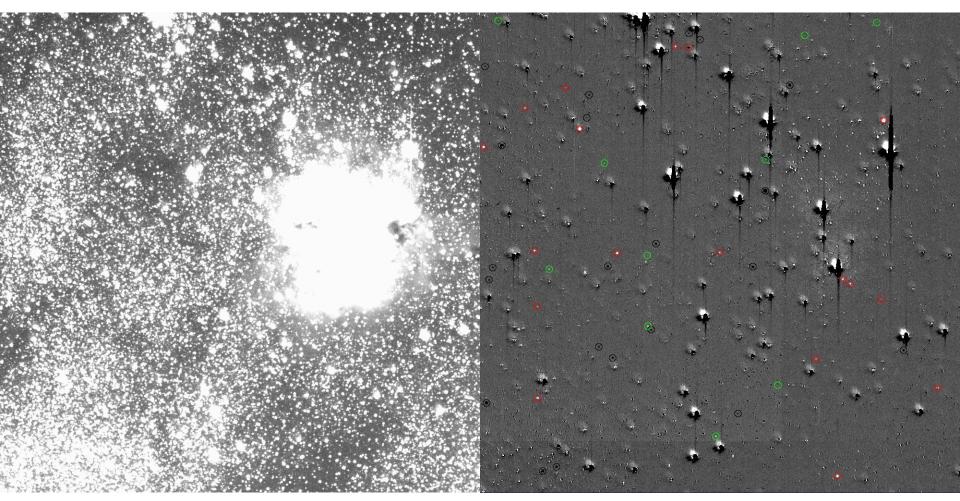
- Domes (Ash) on HKO, MLO
- German mounts (APM)
- 0.5m telescopes (DFM)
  - f/2 Schmidt
  - 8 filters (co, uvgri, BVRI, H $\alpha$ ,[OIII])
- 10k cameras (IFA/STA)
  - 1.86" pixels, 5.4°x5.4° field of view
- 50Mb/s ethernet



- 50,000 deg<sup>2</sup>/nt (4xsky/2) to m~19.5 in c (g+r) or o (r+i)
- Computers totaling >1PB, 2TB, 500 core
- Portable (?!) software

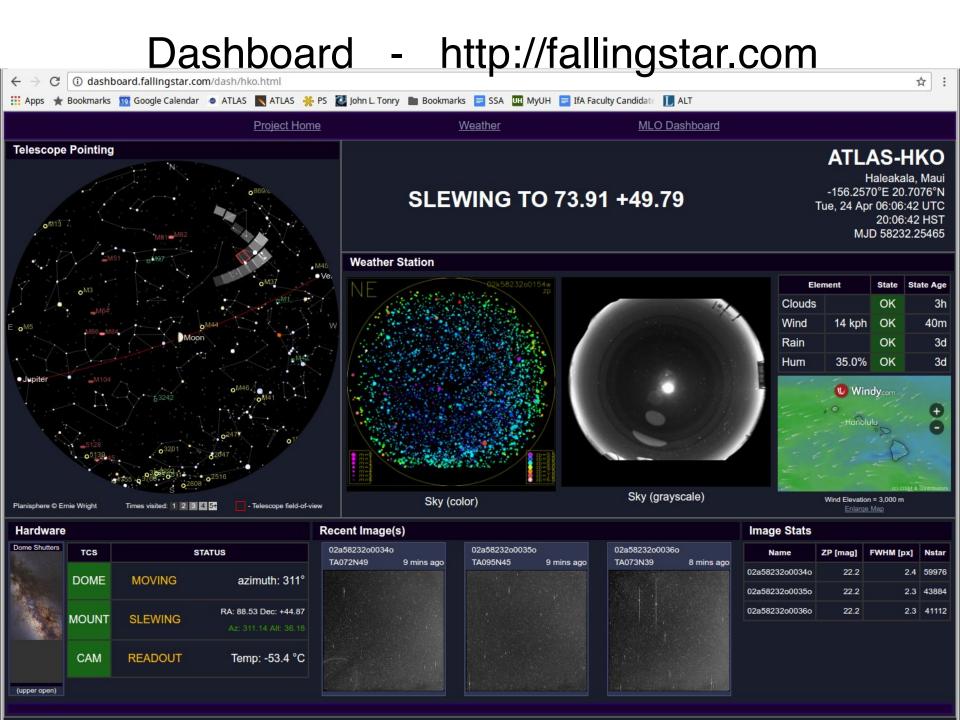


#### Autonomous operation, reduction, and analysis



- 2 x 1,000 image = 0.5 TB per night
- 700,000 images to date
- Fully robotic system
- Gaia astrometry, Pan-STARRS photometry

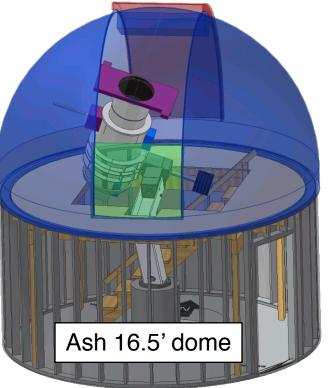




# ATLAS DETAILS

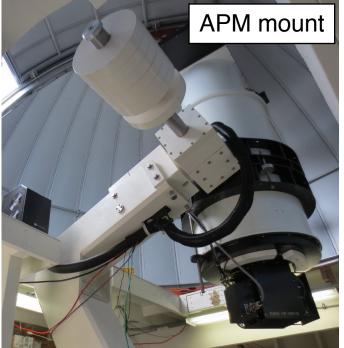
Lots of details about hardware and software

#### **Enclosures and Mounts**



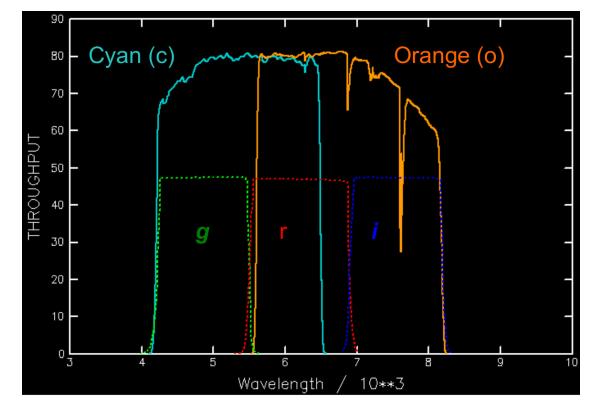






### Filters

- ATLAS c, o, t
- SDSS/Pan-STARRS/SkyMapper u,v,g,r,i,z
- Johnson/Cousins B,V,R,I
- Narrow band Hα,[OIII]



#### **Telescopes and Cameras**

#### DFM telescopes

- 0.5m f/2 Schmidt telescope gives
   1.86" per pixel over 8° field without vignetting
- PSF is ~2 pixels; m<sub>lim</sub>~19.5 in 30 sec exposure
- Acam
  - STA-1600: 110 Mpixel, 10e- read noise, ~8 sec readout, good QE, good cosmetics
  - TEC cooling to <-50°C, negligible dark current
  - Permanent vacuum
  - Sub-um positioning of detector in piston, tip, tilt (necessary for an f/2 system)
  - >1,000,000 images so far...

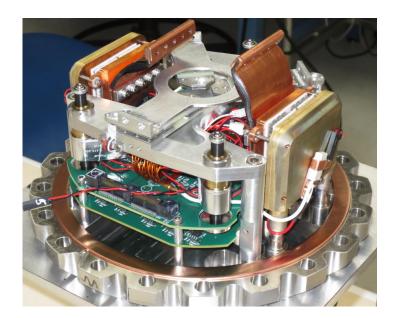


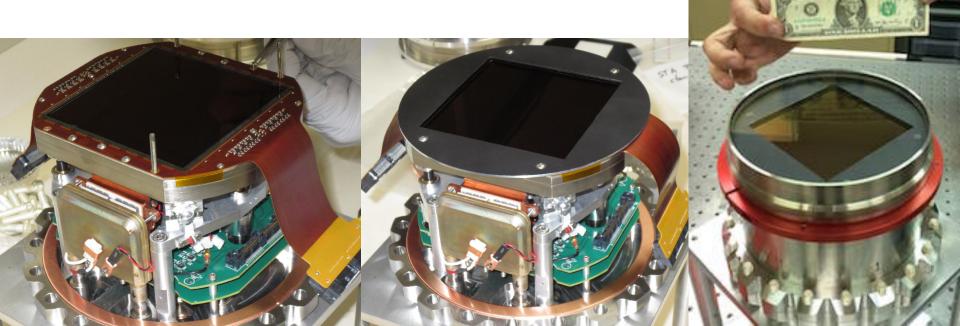




#### Acam

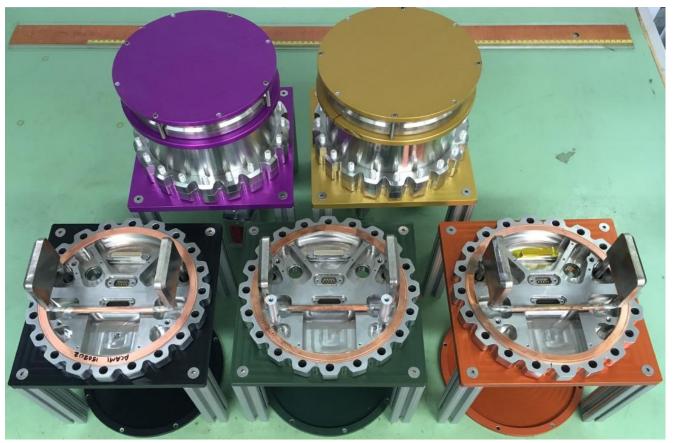
- All metal: no pumping required
- Buffer PCBs: no interference
- TEC cooling
- Picomotors
- Large area to volume ratio



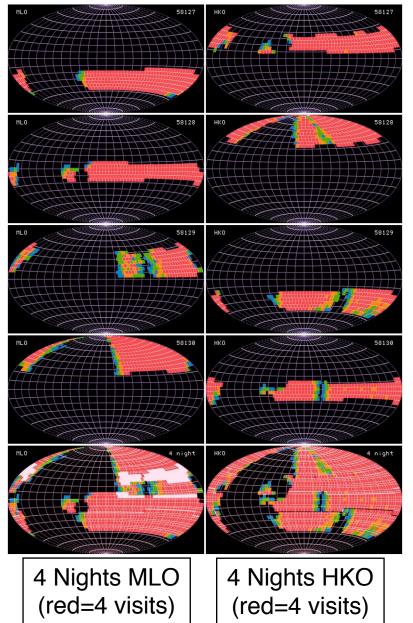


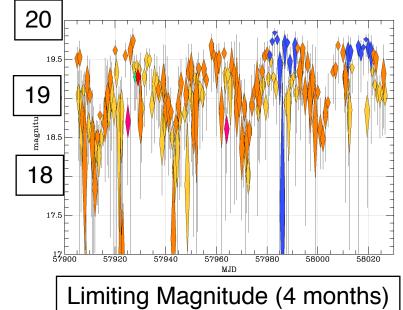
#### Five More Cryostats Ready for a Home...

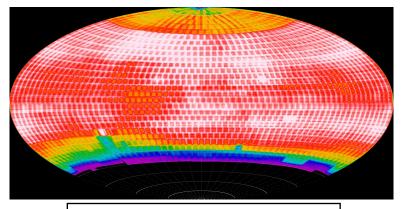




#### Survey Strategy





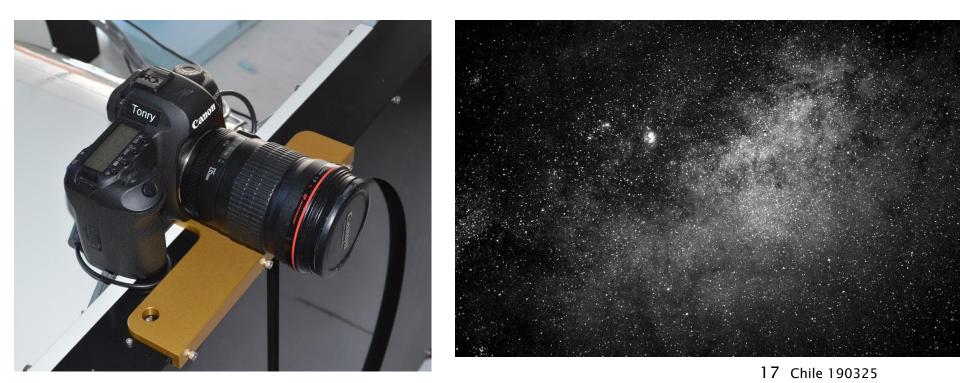


Sky coverage to date (red=500 visits)

16 Chile 190325

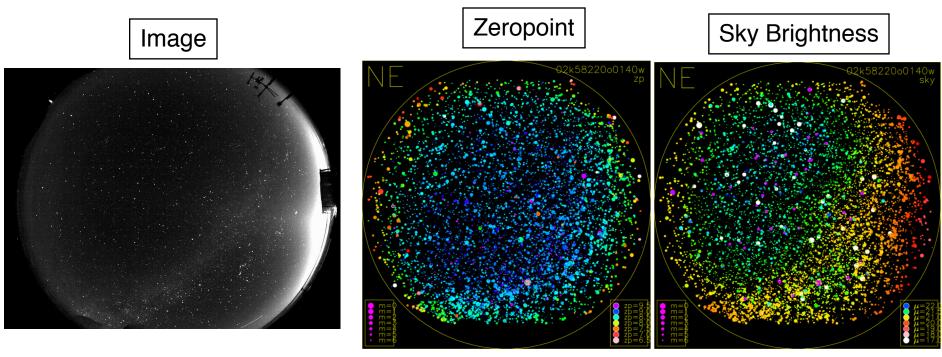
#### Auxiliary Camera #1

- Each telescope also has a Canon 5DII with 135mm f/2 lens taking simultaneous exposures.
  - 300,000 deg<sup>2</sup>/nt at  $m_{lim} \sim 14$ ,  $m_{sat} \sim 6$
  - Fully reduced and quantified (WCS good to ~1" and photometry good to ~0.03 mag)
  - RGB color retained but not currently reduced



#### Auxiliary Camera #2

- Each site has a Canon 5DIII with 10mm f/4 lens taking continous exposures
  - All sky every 40 sec at  $m_{lim}$ ~7,  $m_{sat}$ ~0
  - Fully reduced and quantified (WCS good to ~30" and photometry good to <0.1 mag)
  - RGB color retained but not currently reduced

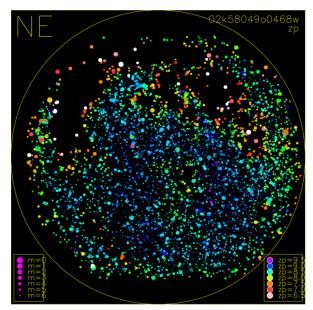


18 Chile 190325

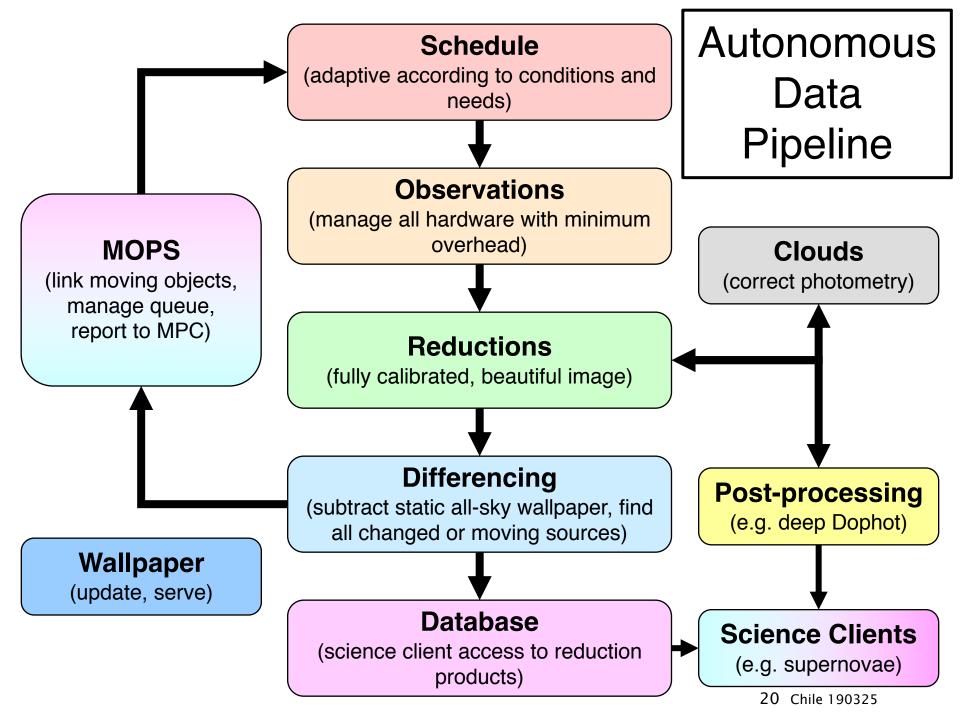
#### Photometric all-sky measurement







19 Chile 190325

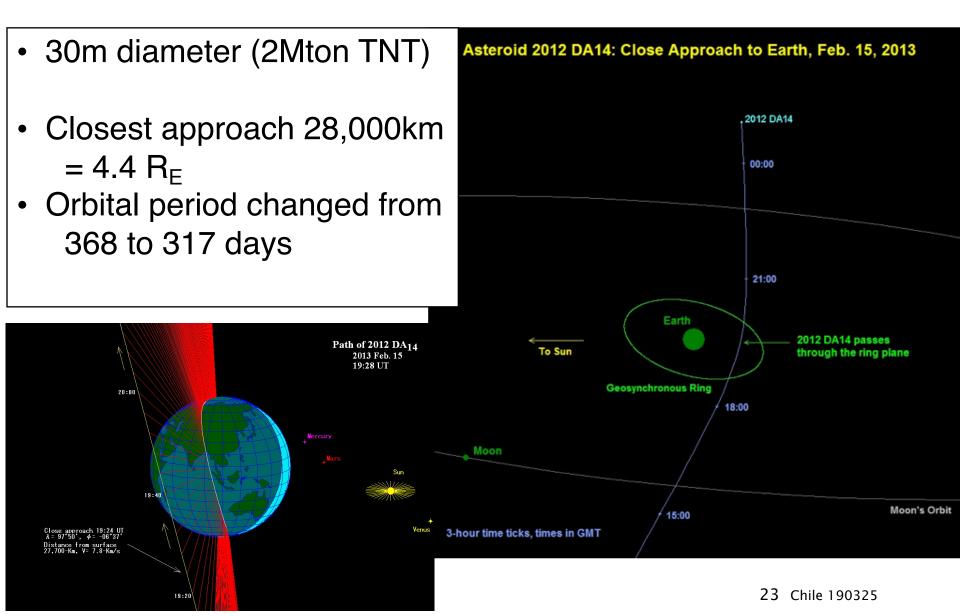


#### **Processing Time and Latency**

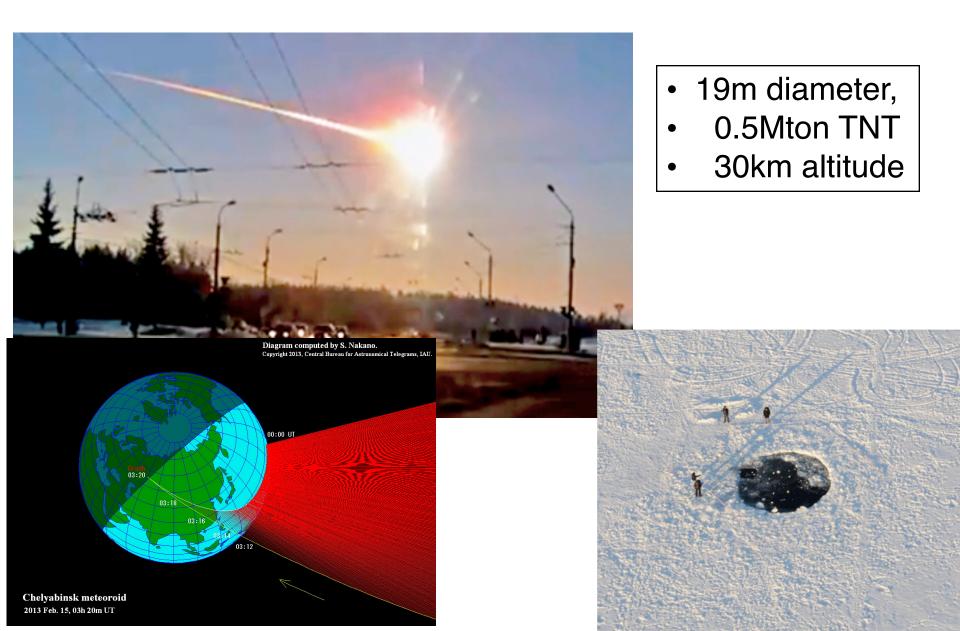
- Latency from shutter open to final results ~30 minutes
- Latency from start of quad exposure to asteroid warning ~90 minutes

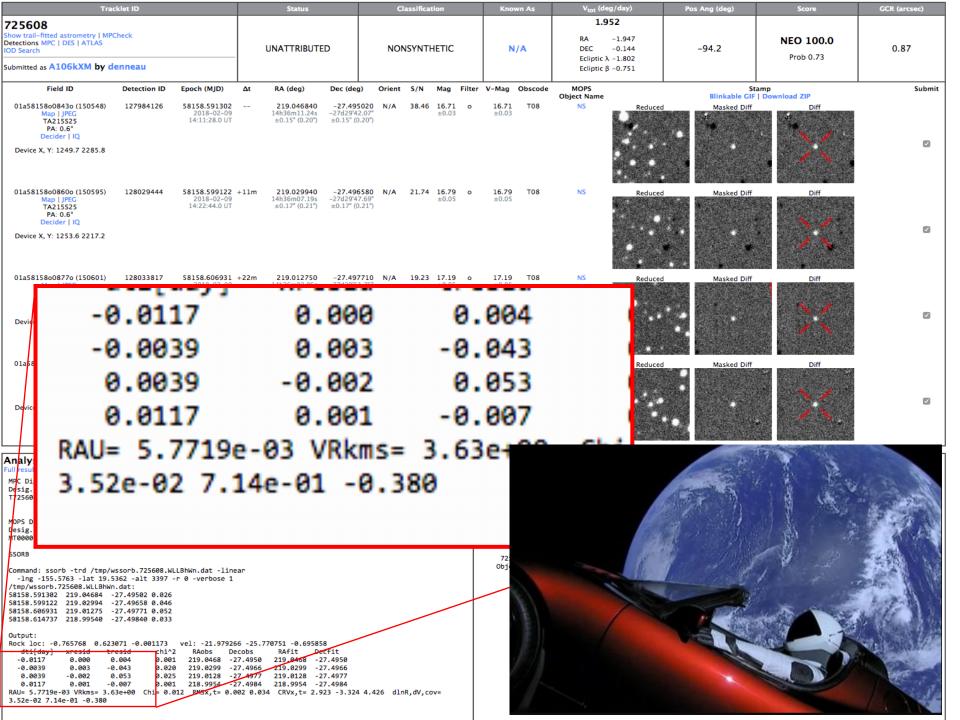
CPU	Elapsed	Stage
40	40	take exposure, save to disk as a raw image
40	80	flatten image
500	250	measure the brightest $\sim 60,000$ stars (dophot)
20	270	find initial astrometric solution (Lang et al. 2010)
10	280	determine final astrometric and photometric solution
20	300	perform cloud detection and correction
10	310	calculate auxiliary metadata, compress and save image
250	560	produce wallpaper template matching image
600	1160	subtract wallpaper from image (hotpants)
750	1410	detect sources in difference image to $3\sigma$ , trim to $5\sigma$ (tphot)
180	1590	classify sources, write final detection table
120	1710	run primary science client MOPS to detect moving objects
900	610	measure $\sim 10^5$ to $\sim 2\times 10^6$ stars (depending on galactic latitude) to $5\sigma$ (dophot)

#### 2012 DA 14: 2013-Feb-15



#### Chelyabinsk: 2013-Feb-15



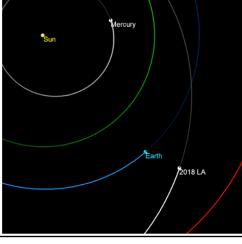


# 2018 LA

- Discovered by Rich Kowalski (Catalina Sky Survey: G96)
  - 02 JUN 2018 08:22 UTC
  - Observed by ATLAS 12:00 UTC
  - Impact over Namibia 16:44 UTC
  - 2 m diameter (H=30.6), 0.4 kT

2018 LA seen before impact in NE South Africa UTC 16:44 (Courtesy Barend Swanepoel) https://www.youtube.com/watch?v=rnBvSNYy-EY

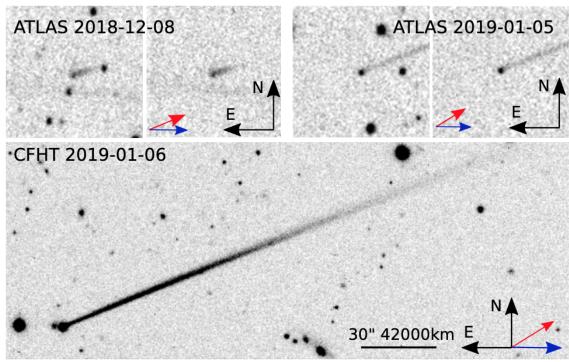




Orbital configuration 02 May 2018

#### Asteroid Gault (6478)

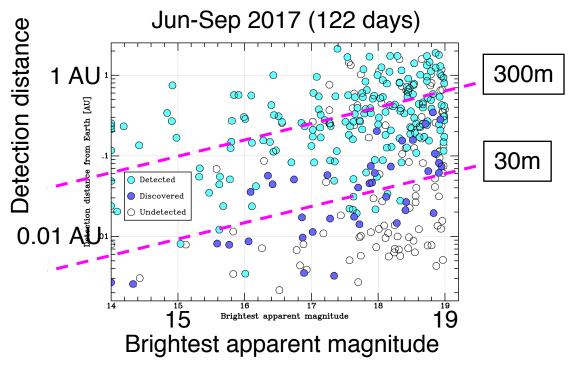
- Discovered by ATLAS collaborator Ken Smith while inspecting images for supernova transients (would have been spotted by the asteroid team 6 hours later)
- 6–10km size, 2.3 AU, inner MB
- Previously inactive, episodic outbursts suggest ongoing rotational disruption.

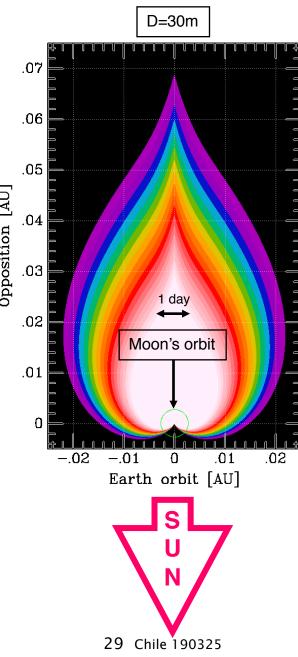




#### ATLAS and NEOs

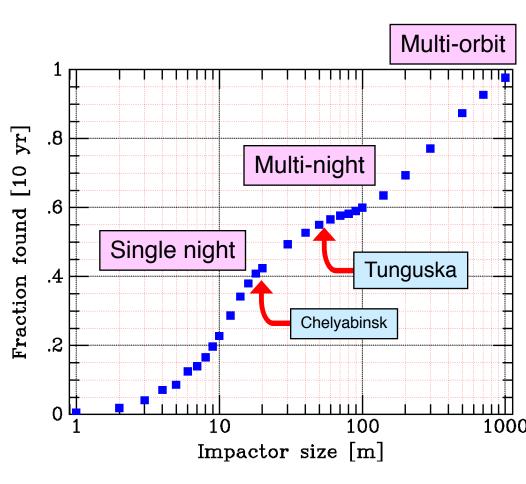
- ATLAS should have 2—9 NEOs of
- J~30m in view at the depending on poorly known mutual depending on asteroids that come within Most 30m asteroids that come within distance should be detected •





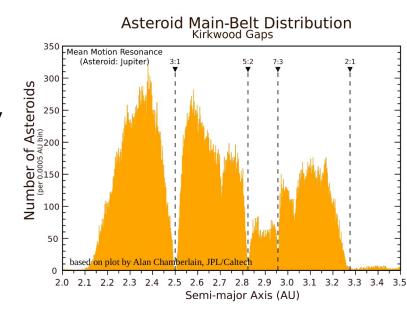
#### **ATLAS Impactor Discovery Probability**

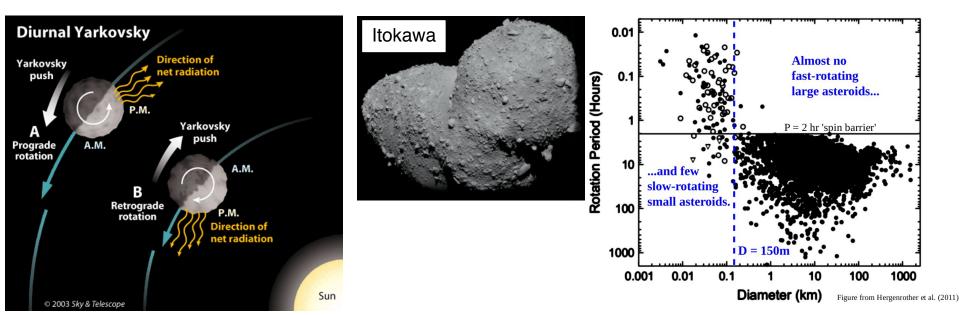
- ATLAS discovery probability depends on size and survey duration
  - Small (<10m) only seen on last day or two.</li>
  - Medium (10–140m) seen for days to weeks before impact.
  - Large (>140m) are often seen on orbits prior to impact.



#### Non-gravitational Forces Create Fresh Hazard

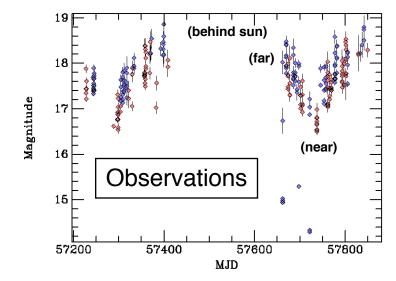
- Yarkovsky
  - Slowly changes orbits
  - At resonance orbits change chaotically
- YORP (tangential Yarkovsky) and "Spin-barrier"
  - YORP can spin up asteroids and cause them to fission, changing orbit





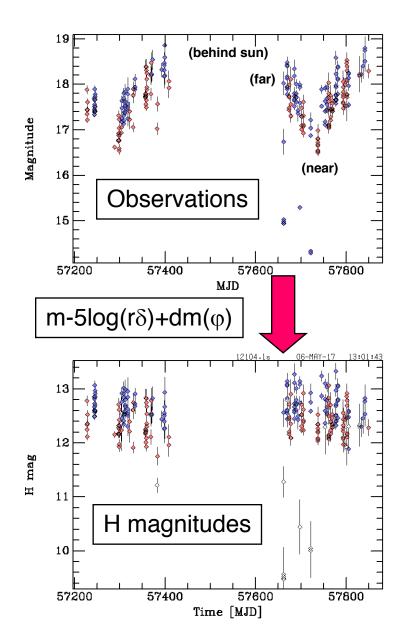
#### Asteroid light curves

- Asteroid observed magnitudes
  - Images and difference images



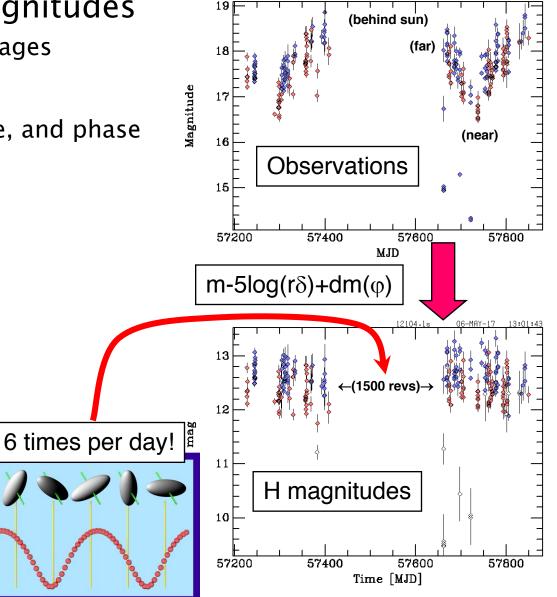
# Phasing light curves

- Asteroid observed magnitudes
  - Images and difference images
- Correct to "H"
  - Light travel time, distance, and phase function



# Phasing light curves

- Asteroid observed magnitudes
  - Images and difference images
- Correct to "H"
  - Light travel time, distance, and phase function



# Phasing light curves

- Asteroid observed magnitudes
  - Images and difference images
- Correct to "H"

.05

Time [day (mod 3.9452 hr)]

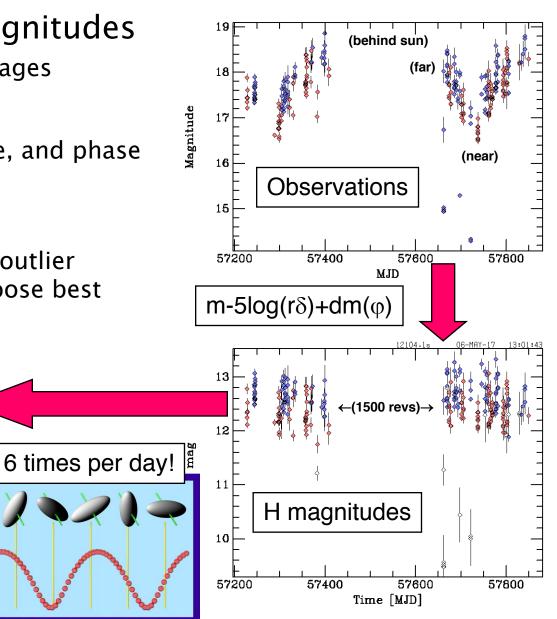
-.5

mag

- Light travel time, distance, and phase function
- Search for periodicity
  - Lomb-Scargle, color fits, outlier rejection, Fourier fits, choose best

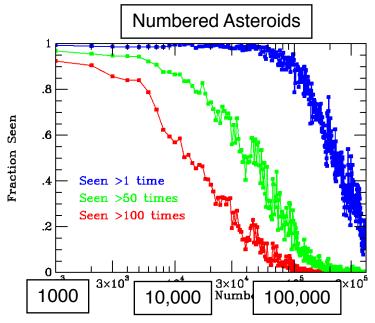
Phased

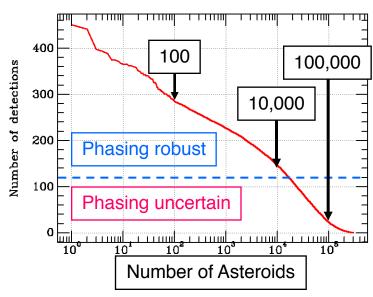
.15



#### Asteroid Properties from ATLAS

- ATLAS provides more than astrometry and orbits
  - 8.7 million detections of 271,919 numbered asteroids as of May 2017 (numbers have doubled since)
  - Photometry: size, color, taxonomy, phase function...
  - Light curves: rotation, shape, spin axis
- >100,000 asteroids will be measured as observations accumulate; change in properties may emerge...





#### **Useful Byproducts**

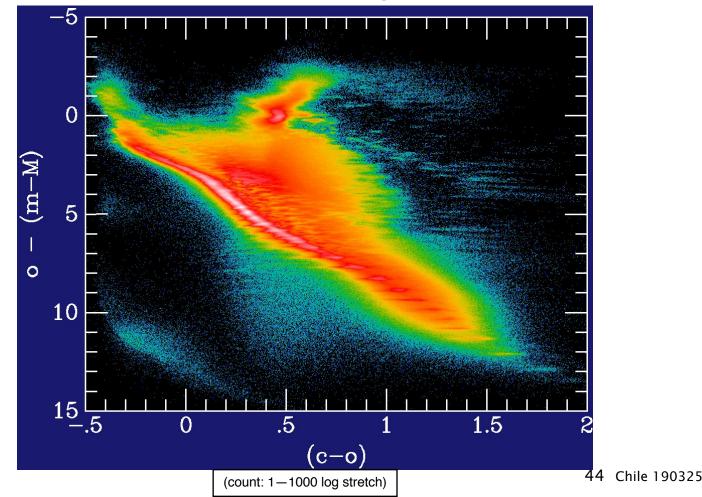
- ATLAS is putting in the extra work to make things that can be useful to others.
- Software (with man pages!)
  - Fisheye pipeline
  - Sort library
  - colmerge = merge two files by matching column entries
  - xclist = pattern match two files of x,y and x',y'
  - puma = get a 3D location for points on an asteroid or satellite tracklet
- Refcat2
  - All sky griz to m~19 with Gaia DR2, available from STScI and arXiv
- Data products (in addition to asteroids to MPC, maybe)
  - ATLAS has better time sampling than any other survey (4x per night)
  - Ongoing updates for all variables with m < 19
  - Light curves of everything with m < 19
  - Outburst alerts for AGN, unhappy stars, etc.

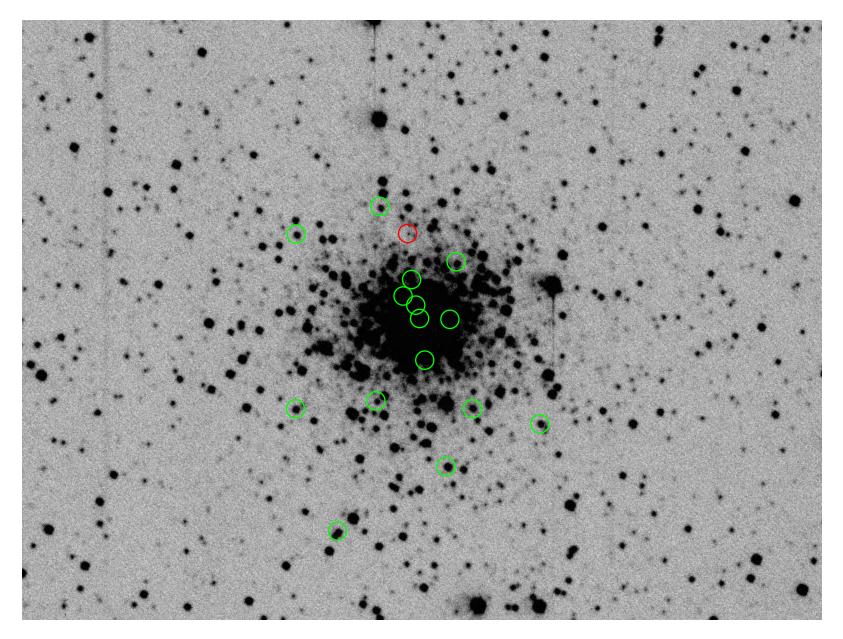
#### Refcat2 – arXiv 1809.09157

(green=-0.005, red=+0.005) Gaia+2MASS subset Pan-STARRS SkyMapper SkyMapper DR1.1 All-sky g,r,i,z from: ATLAS Gaia DR2 and 2MASS **ATPASS** Pan-STARRS, Dec>-30° ATLAS gri, Dec>-50° APASS/ATLAS gri, Dec<+20° APASS SkyMapper griz, Dec<+0° 991M stars, G|B|R<19 AP DR9 210M stars g|r|i<17Ζ g

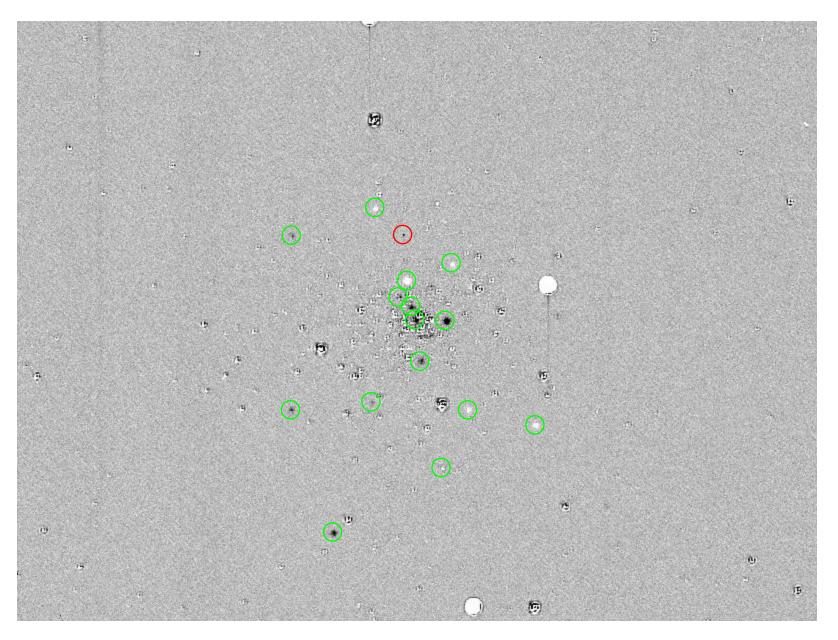
# ATLAS-Gaia HR diagram

- 40M stars have ATLAS light curves and Gaia parallax with error smaller than 10%.
- Every star has a ~1000 epoch light curve behind it





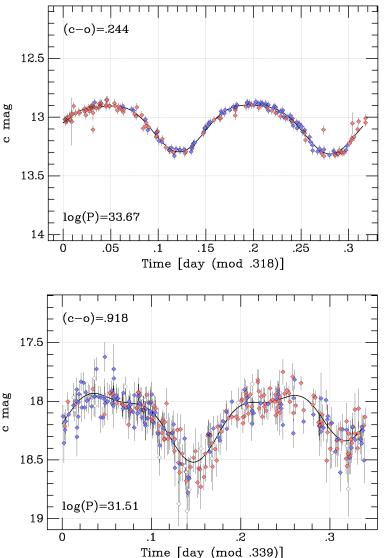
M107 globular cluster RA 248.132 Dec -13.054 47 Chile 190325



M107 globular cluster RA 248.132 Dec -13.054 48 Chile 190325

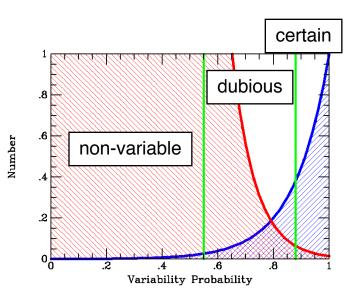
# Variable Stars

- ATLAS has ~500 point light curves for ~250M stars.
  - All (nearly) stars with -45<Dec<+90 and 11<m<19 examined</li>
  - SNR ~10 at m~18, per detection
  - Sampling ~4/night over ~1 hour, revisit every ~2 days
  - c~(g+r) and o~(r+i) colors
  - Lomb-Scargle and variability statistics computed for all light curves
- ~5M light curves with ~1M variables from DR1 140M stars are now available from STScl (Heinze et al. arXiv:1804.02132)

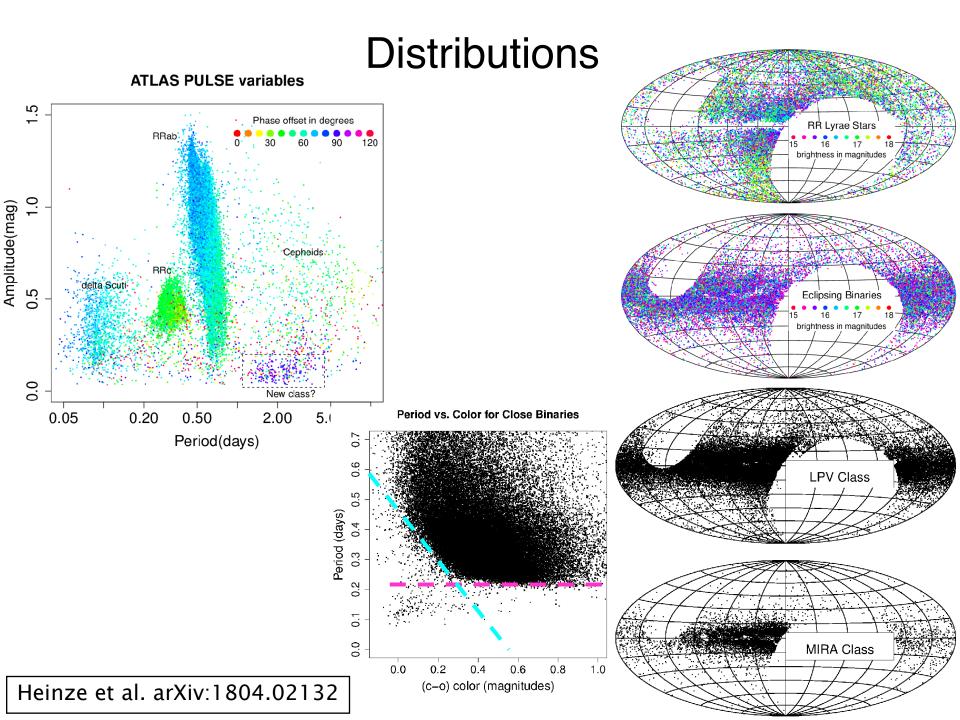


# **Classifying Stars**

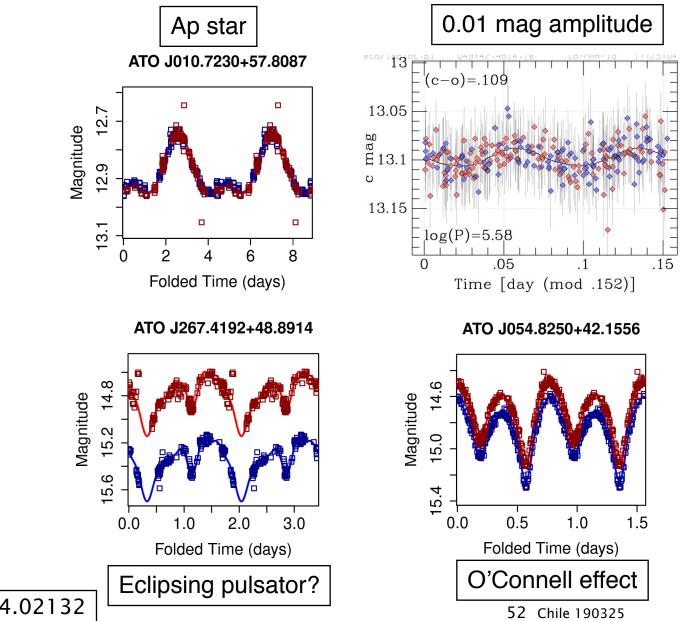
- Machine learning classification of 140 million light curves
  - Morphological classes such as "sinusoidal", "pulsating" (sawtooth), "close binary", "distant binary", "mira", etc.
  - Good but not perfect correspondence with physical classes: work to be done
  - ~0.5M are "certain" (low false alarm rate)
  - ~5M are "dubious" (10:1 false alarm rate)
- Counts ( "certain" only)
  - Eclipsing 100,000 (70% new)
  - Pulsating 50,000 (40% new)
  - Long period variable 50,000 (60% new)
  - Sine 100,000 (90% new)



Red = non-variable stars Blue = variable stars



# **Interesting Light Curves**



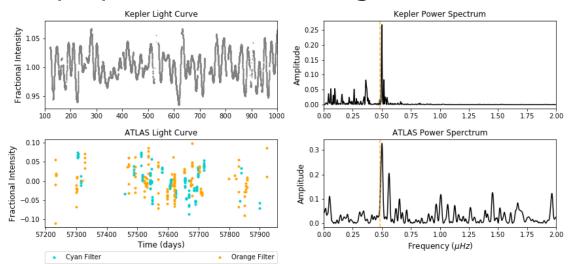
Heinze et al. arXiv:1804.02132

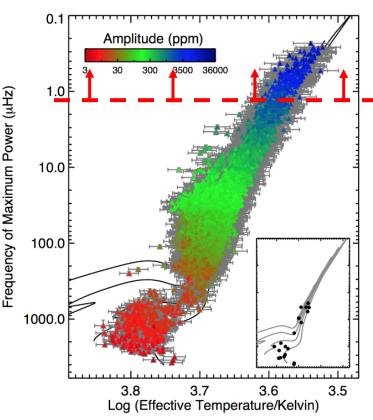
# Asteroseismology

 ATLAS light curves reveal giant star oscillation frequency, providing luminosity for a given temperature and mass.

 $\frac{\nu_{max}}{\nu_{max,\odot}} \approx \frac{M}{M_{\odot}} \left(\frac{T_{eff}}{T_{eff,\odot}}\right)^{3.5} \left(\frac{L}{L_{\odot}}\right)^{-1}$ 

 60,000 stars in Milky Way available (more than Kepler or TESS) for studies of dust extinction and stellar properties (Huber & Auge).



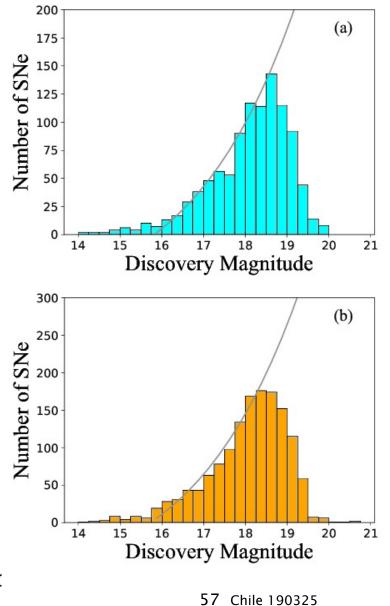


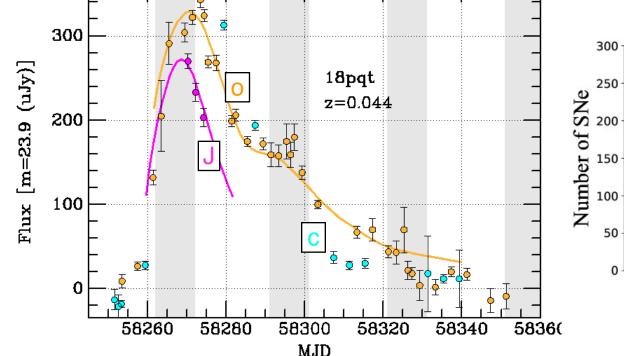
# **Transients and Cosmic Variables**

- ATLAS sees ~5,000 supernovae per year to V~19
- There are ~200,000 AGN brighter than V~19 that ATLAS monitors daily.
- ATLAS depth and SNR at m~19 depends on averaging time:
  - ~1 hour (1 exposure),  $m_{lim}$ ~19.5, SNR > 7 at m~19
  - ~1 day (4 exposures),  $m_{lim}$ ~20.2, SNR > 14 at m~19
  - ~1 week (20 exposures),  $m_{lim}$ ~21, SNR > 30 at m~19
  - ~1 month (50 exposures),  $m_{lim}$ ~21.5, SNR > 50 at m~19

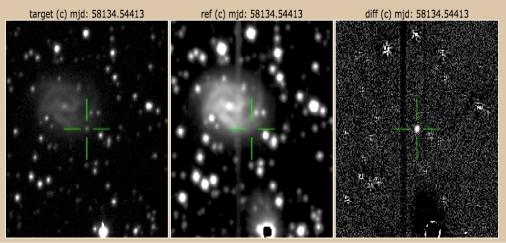
# **ATLAS SNIa Discoveries**

- ATLAS can find (nearly) all SNIa that explode within z<0.1
  - ~5000 per year
  - SNR sufficient to establish decline rate
  - Follow-up IR photometry at peak and spectrum can get ~7-10% distance.





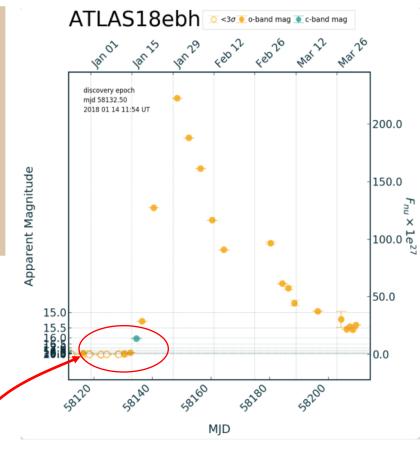
#### Most nearby SN detected within first ~24hrs



#### <u>Example :</u>

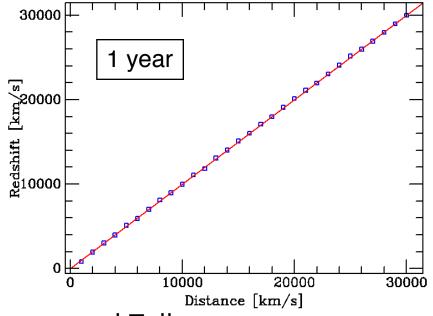
ATLAS18ebh = SN2018gv NGC2525, 20 Mpc Normal Type Ia ATLAS early detections and limits constrain explosion to ~12hrs

Automated forced photometry run on all / ATLAS transients, reliable photometry and limits instantly (*forced using tphot*)



# Hubble Flow, Large Scale Flows

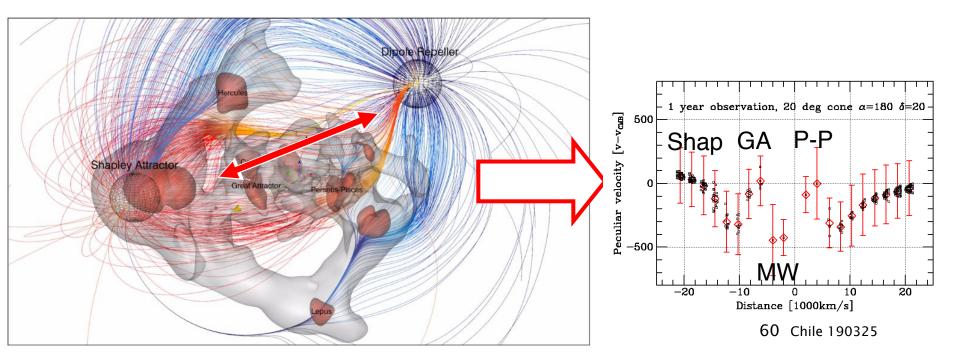
- Use SNIa as standardizable candles:
  - ~10% distance accuracy per SNIa
  - $\sim 1$  SNIa each year per (30Mpc)<sup>3</sup>.
  - Therefore measure the distance of a shell of thickness 1,000 km/s with an accuracy of 100 km/s per year <u>independent of distance</u>, limited when systematics dominate (z~0.1?)
  - Measure Dark Matter distribution:
    - Monopole (Hubble bubble)
    - Multipole (large scale flows)
  - Also require follow-up of each SN
    - 2-3 epochs IR photometry
    - spectrum for typing and z



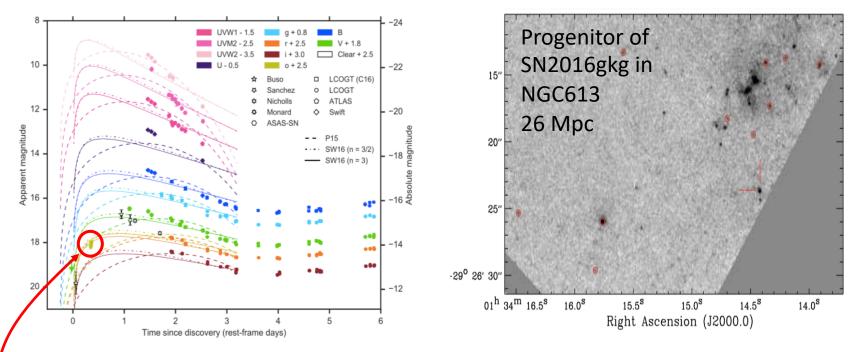
- Pilot project now underway with Shappee and Tully...

# Large Scale Flows and Dark Matter

- Constrained N-body simulations can predict dark matter distribution from observations of large scale flows (e.g. Tully et al. Cosmic Flows).
- These can be directly tested (and improved) in 1 year of ATLAS SNIa observations.



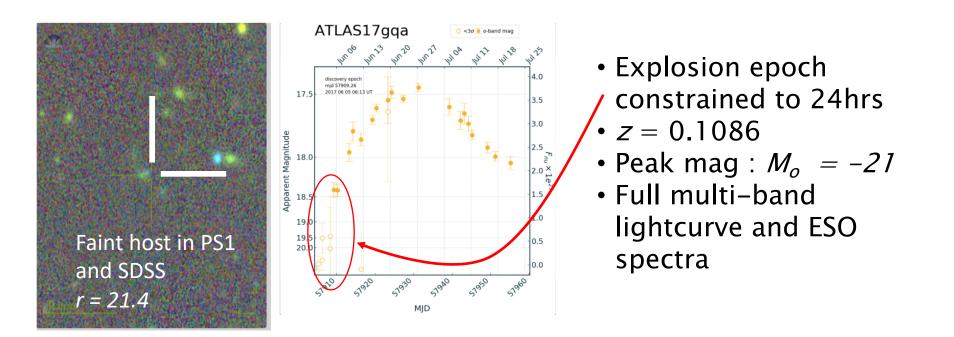
#### Detections of very young supernova : shock breakout



- SN2016gkg : type IIb with progenitor detection AND very early lightcurve (shock breakout)
- Progenitor in HST pre-explosion image gives luminosity and mass
- ATLAS constrained explosion epoch (about 8hrs after explosion)
- Can use both to test progenitor mass, luminosity and radius and shock physics

Arcavi et al. 2017, Tartaglia et al. 2017, Kilpatrick et al. 2017

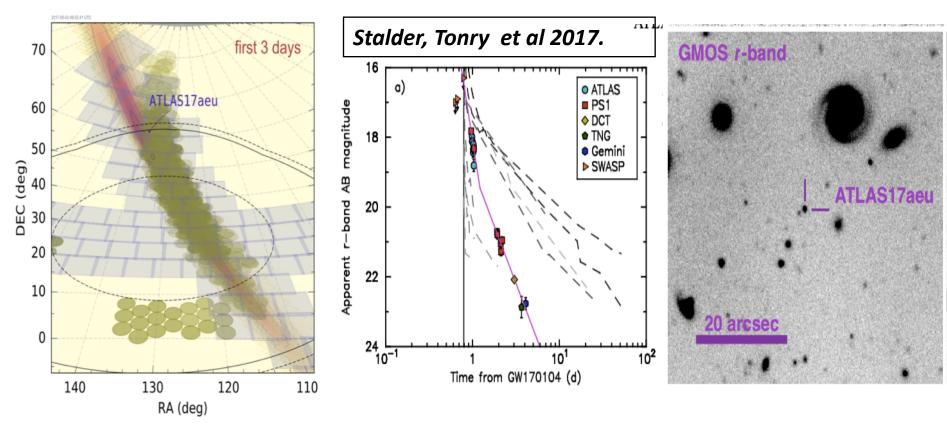
# ATLAS17gqa : very unusual super-luminous SN



- ATLAS + PESSTO paper in prep (Chen et al.)
- Stunning x-shooter spectra, showing host of narrow <u>absorption</u> !
- Spectra + bolometric lightcurve : suggest pulsational pair instability supernova

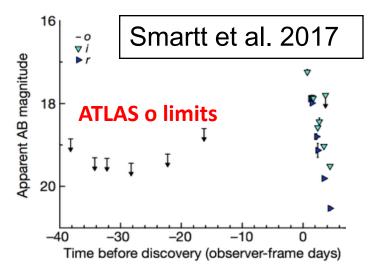


#### Follow-up of LIGO-Virgo GW sources



- We showed in O1 and O2 : Powerful facility for finding bright, fast sources in LIGO-Virgo maps
- Discovered ATLAS17aeu (GW170104) fast transient within 24hrs of GW source
- Turned out to be the afterglow of a GRB but only 3<sup>rd</sup> time a GRB afterglow was detected without a high energy trigger
   63 Chile 190325

# GW170817 : ATLAS limits pre-discovery, closest deep limits on the kilonova AT2017gfo

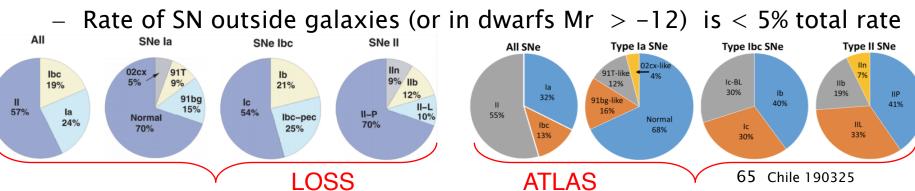




- ATLAS would easily have detected AT2017gfo, except our survey schedule had shifted away from the sun
- Kilonovae are detectable on ATLAS within ~100 Mpc
- Scolnic et al (2018): LIGO-Virgo rates of NS-NS mergers imply ATLAS should find 2 – 10 kilonovae per year, irrespective of GW trigger. ATLAS is the best survey for detecting kilonovae with no GW trigger
- McBrien et al. (in prep) : several candidates from 18 months survey, all foreground CVs, reliable volumetric rate estimate coming. Will provide independent constraint on NS-NS merger rates.

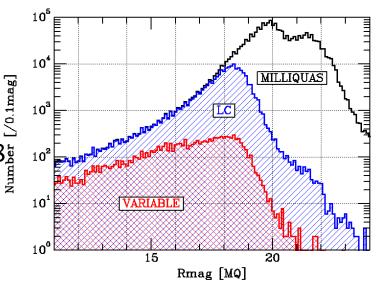
# ATLAS Local Universe SN rates

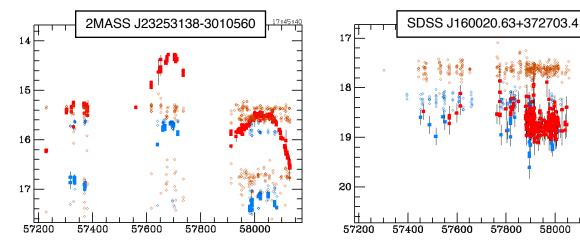
- Lick Observatory SN Search (LOSS)
  - 10 year results (Leaman et al 2011, Li et al 2011)
  - 180 SNe within ~80 Mpc, volume limited sample
  - But targeted galaxy survey creates bias
- ATLAS initial results
  - 1.7 year period (mostly 1 telescope). No galaxy (metallicity) bias full volume: all SNe regardless of dwarf host (or no host evident)
  - 77 SNe within ~60 Mpc, volume limited sample
  - Each year we will equal LOSS statistics within ~80 Mpc (but no bias), good light curves and spectra for all
- Preliminary results
  - Agreement with LOSS rates, e.g.  $Rcc = 0.48 \pm 0.07 \times 10^{-4} Mpc^{-3} yr^{-1}$

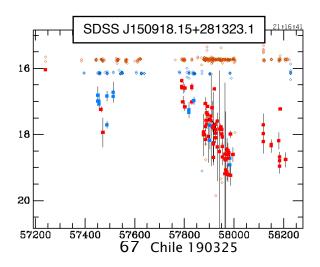


# Quasars and ATLAS

- The "Milliquas 5.2" sample
  - ~0.6 million confirmed QSOs
  - ~1.3 million suspected QSOs
- ATLAS DR1 (Dec>-30)
  - Light curves for ~10<sup>5</sup> brighter than R~18 $\frac{1}{2}$
  - $\sim 1/3$  at m<15.5 are clearly variable
- ATLAS DR2 (Dec>-45)
  - Light curves for  $\sim 2 \times 10^5$ , better SNR, better time sampling, longer duration







# More Opportunities

The data from ATLAS carries lots and lots of other science...

# **Gravitational Lensing**

# Microlensing

- Lots of generic microlensing events
- Near-field events: lensing star close enough to see lens and source separate (after a while)
  - m=18 expect ~40 mas/yr proper motion
  - Total expected is ~23 events per year at m<18, 58 events per year at m<19</li>
- ATLAS will see ~30/yr total, and ~10/yr at high SNR and time coverage

#### • Strong lensing

- Expect ~40 AGN lensed at x3 or more, and ~7 AGN lensed at x10 or more.
- These are likely to have multiple images and accessible time delay

#### Results



Nobody has yet looked in our 500,000,000 detections...

# Galaxies

### Low surface brightness

- ATLAS does very well for building up SNR at low surface brightness.
- Ongoing project to determine all-sky surface brightness to high accuracy in order to remove atmospheric glow and scattered light...

# • Low metallicity

- ATLAS can search for H $\alpha$  and [OIII] at z<0.004
  - all-sky survey to  $m_{AB} \sim 17$  (point source) in one night
  - $f \sim 2x 10^{-14} \text{ erg/s/cm}^2$  or  $L \sim 10^5 L_{\odot}/\text{s}$  at 17 Mpc.
- Outbursts comparable to galaxy luminosity will be seen in substantial numbers
  - ~20 BH stellar accretion events (MV ~ -18) per year at 0.1 mag photometric accuracy

#### Results



Nobody has yet made a case for the observations...

# **Unknown Unknowns from Fisheyes**

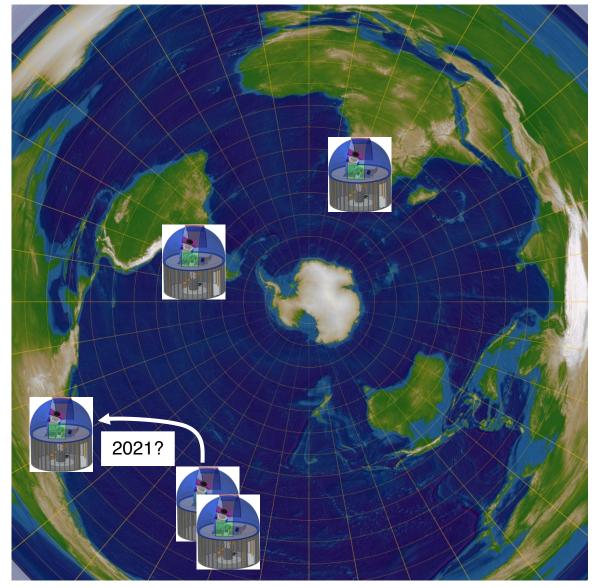
#### Fisheyes monitor all sky continuously

 100mi separation disambiguates flashes that occur in the atmosphere

nth

- $m_{lim} \sim 7$  for  $\Delta t < 1$  min
- $m_{lim}$ ~9 for  $\Delta t$ <1 hour
- $m_{lim} \sim 10$  for  $\Delta t < 1$  day
- m<sub>lim</sub>~12 <mark>/</mark>

# ATLAS expansion (late 2020)





Heather Flewelling, Planetary Defense Researcher



John Tonry, ATLAS Pl



Larry Denneau, Co-Pl



Brian Stalder, Postdoc (now with LSST)



Ken Smith



Ari Heinze, Postdoc



Stephen Smartt



Henry Weiland, Observatory Tech





# The ATLAS Team

#### • IFA Manoa

- John Tonry
- Larry Denneau
- Andrei Sherstyuk RIP
- Brian Stalder
- Ari Heinze
- Henry Weiland
- Jessica Young
- Karl Uyehara
- Amy Miyashiro
- Richard Wainscoat

#### • IFA Maui

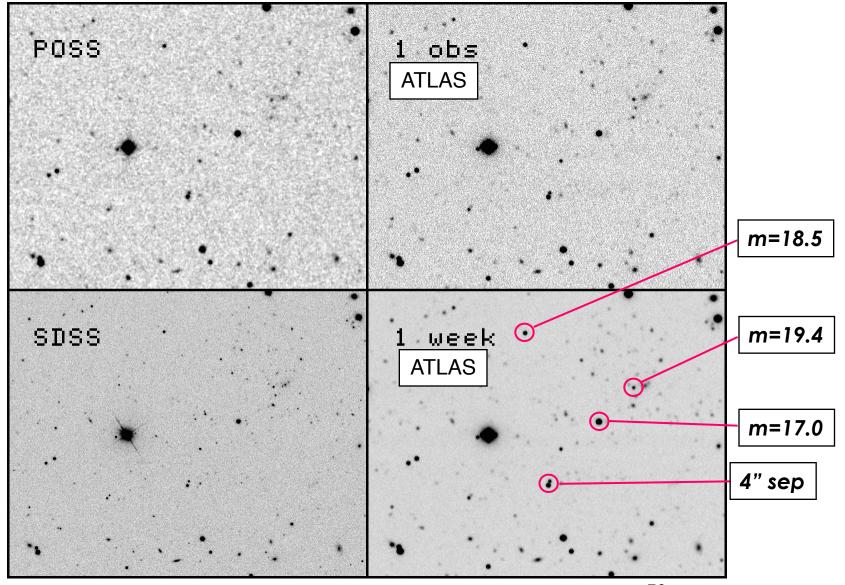
- Mike Maberry
- Joey Perreira
- Tom McCall
- Garry Nitta

- IFA Hilo
  - Klaus Hodapp
- External
  - Armin Rest
  - Stephen Smartt
  - Ken Smith
  - Alan Fitzsimmons
  - Chris Stubbs
- Friends
  - Phil Whitney
  - Gareth Wynn-Williams
  - Chris Oliver
  - The STAC

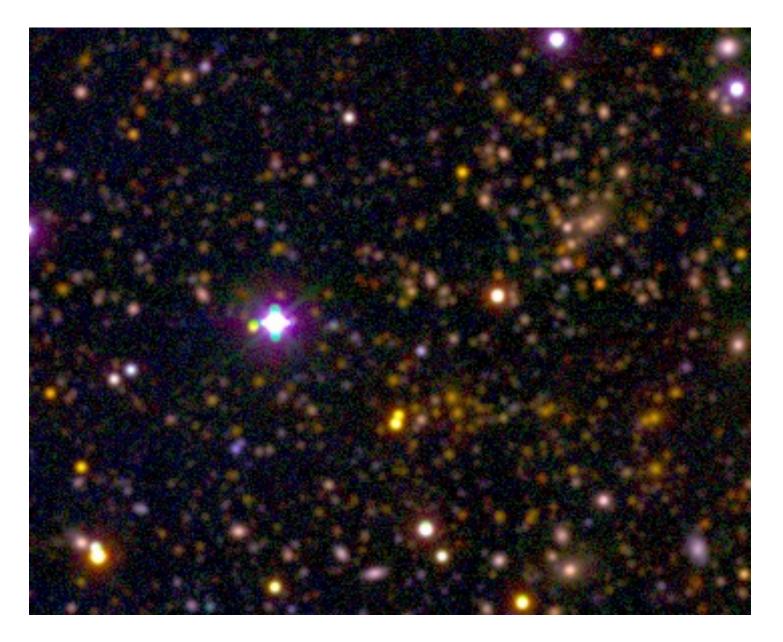
# Static Sky

- ATLAS observes most of the sky ~500 times per year
  - m~23.4 from one year stacked sensitivity at  $5\sigma$ 
    - ~3 mag fainter than POSS
    - ~1 mag fainter than SDSS
    - similar to PS1 3pi 3 year (but only 2 bandpasses)
- <u>But note</u> highly confused for static sources, although excellent for differencing
- <u>Unconfused</u> for variable sources: ATLAS has a sliding sensitivity into variability structure function:
  - m~20.6 at 1 day,
  - m~21.7 at 10 day,
  - m~22.9 at 100 day.

# **ATLAS-POSS-SDSS Comparison**



# ATLAS: one year observation



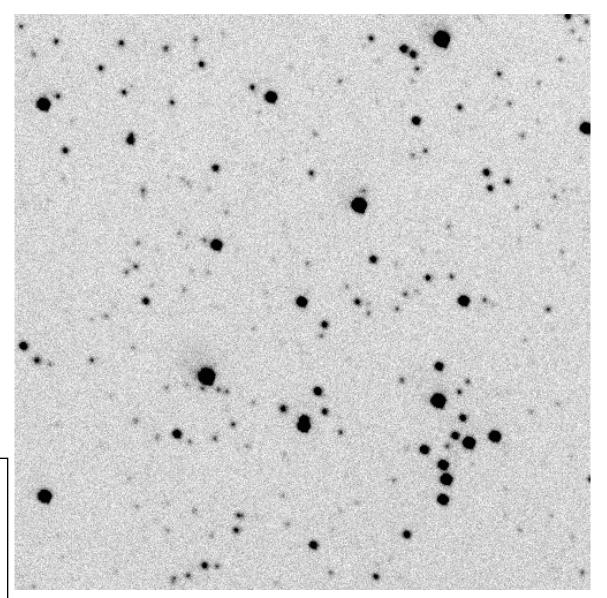
# SDSS



# Schmidt corrector saga: 150601 — 170419

- PSF ~ 3.7 pixels ~ 7.0 arcsec
- m<sub>lim</sub> ~ 19

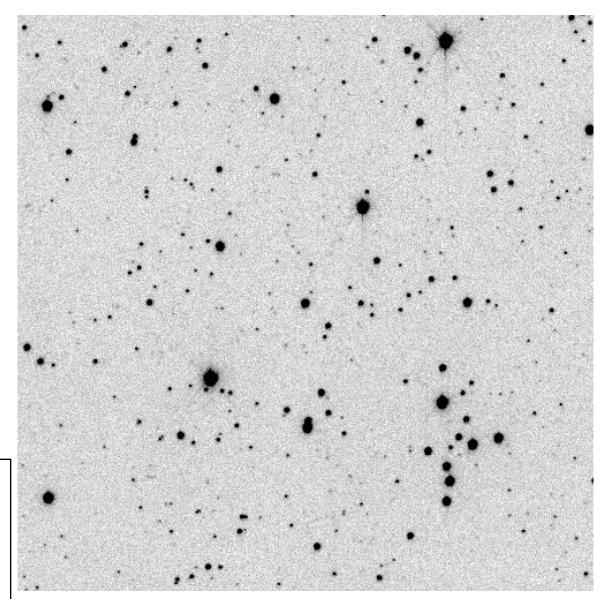
(All results in this talk are from the first telescope on HKO with blurry images. From now on we gain ~1 mag at fixed uncertainty or 2.5x smaller uncertainty at fixed mag.)



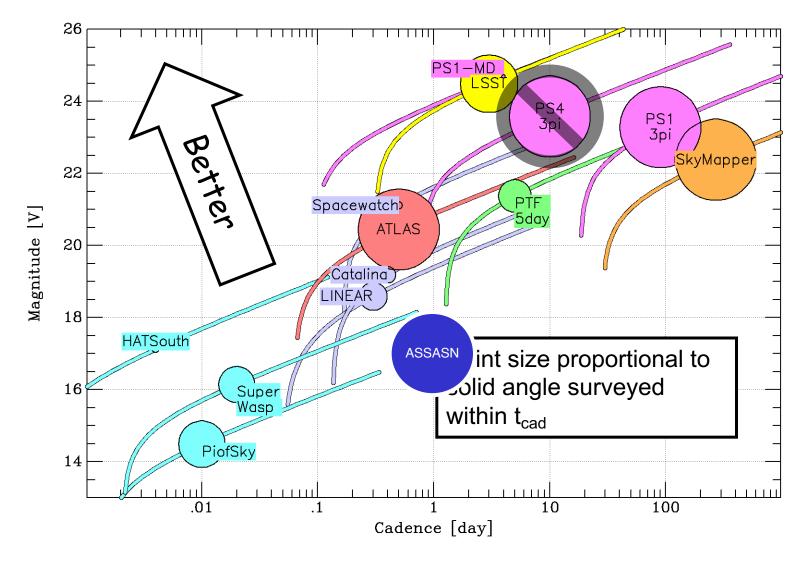
# Schmidt corrector saga: 170420 -

- PSF ~ 2.0 pixels
   ~ 3.7 arcsec
- m<sub>lim</sub> ~ 20
- PSF < 2 pixels?
  - Collimation
  - Detector tilt
  - Focus
  - Tracking
  - Dome seeing

(All results in this talk are from the first telescope on HKO with blurry images. From now on we gain ~1 mag at fixed uncertainty or 2.5x smaller uncertainty at fixed mag.)

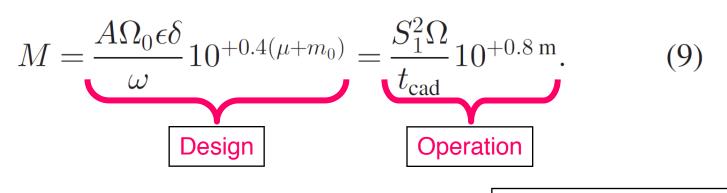


# Survey Speed



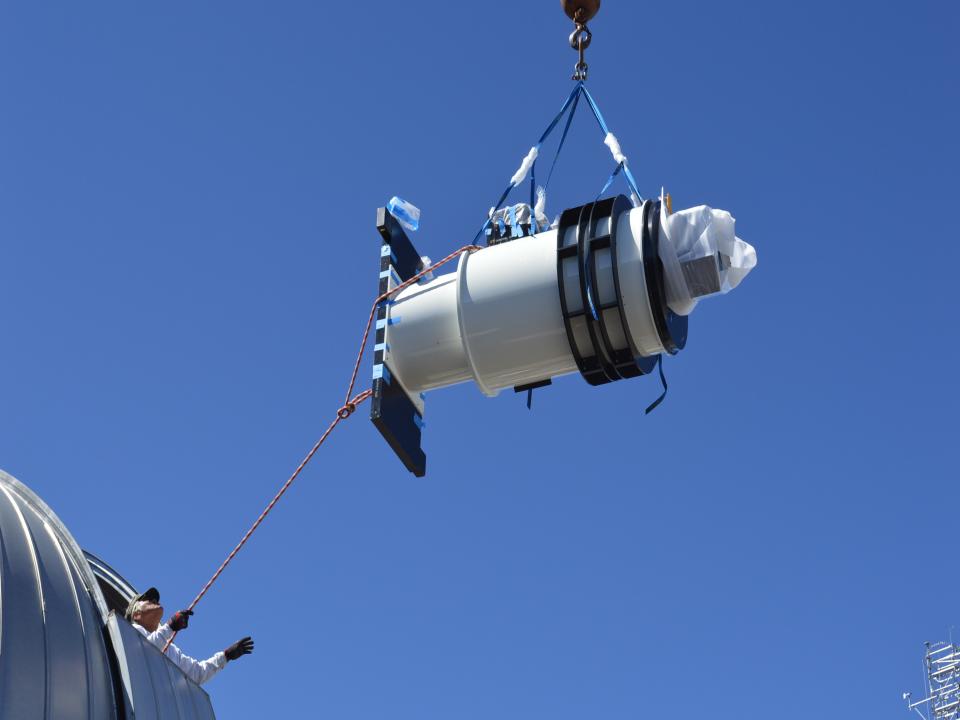
Tonry 2011, PASP 123, 58 84 Chile 190325

### Survey Speed



Tonry 2011 PASP 123, 58

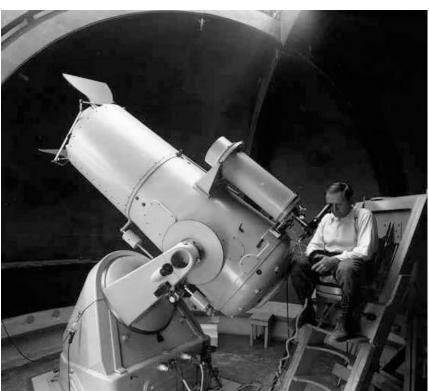
- M = "survey speed"
  A = aperture area
- $\Omega_0 = solid$  angle per exposure ٠
- $\omega$  = PSF area = "effective noise" footprint ٠
- $\epsilon$  = throughput efficiency •
- $\delta = duty cycle$ •
- $\mu$  = sky brightness ٠
- $S_1 = SNR$  per exposure
- $\Omega$  = total solid angle covered in t<sub>cad</sub> m = detection magnitude ٠
- ٠
- $t_{cad}$  = cadence for covering  $\Omega$



# F Surveys & Performance

**Eric Bellm** 

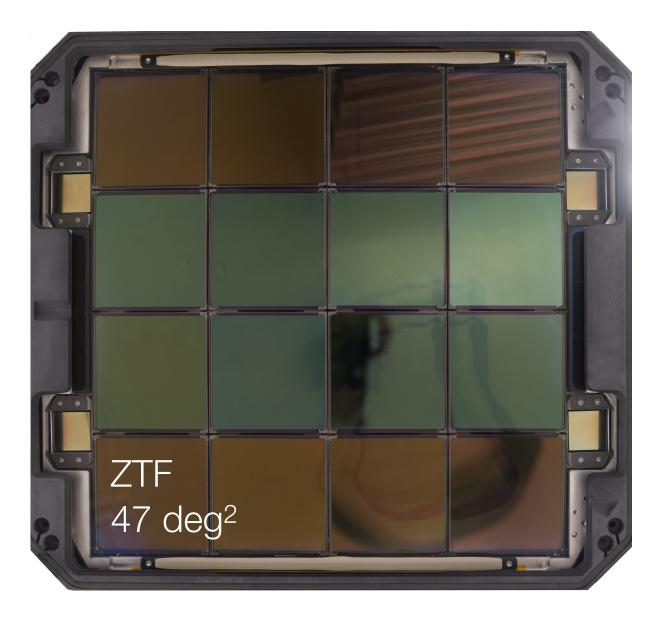
Survey Scientist University of Washington





#### ZTF surveys with a powerful new wide-field camera.

	ZTF
Active Area	47.7 deg <sup>2</sup>
Exposure Time	30 sec
Readout time	8.2 sec
Filters	g/r/i
Image Quality (FWHM)	2.1" / 2.0" / 2.1"
Limiting magnitude	20.8 / 20.6 / 19.9
CCDs	16x 6k x 6k 1.0"/pixel
Filter change time	~ 110 sec with slew to slow
Areal survey rate	4300 deg²/hr



### A PASP Focus Issue provides key references for ZTF.

#### Publications of the Astronomical Society of the Pacific

#### The Zwicky Transient Facility

#### Eric C. Bellm, University of Washington, USA

The Zwicky Transient Facility (ZTF) is a new optical time-domain survey using the 48 inch Schmidt Telescope at Palomar Observatory. An innovative new wide-field CCD mosaic camera provides a 47 square degree instantaneous field of view and fast readout time. This capability enables ZTF to conduct wide-area, high-cadence surveys designed to discover rare astrophysical transients, variables, and moving objects. A dedicated data system provides rapid reduction and near-real-time dissemination of public alerts that anticipate those of the Large Synoptic Survey Telescope. Articles in this focus issue present a broad overview of the ZTF project, including:

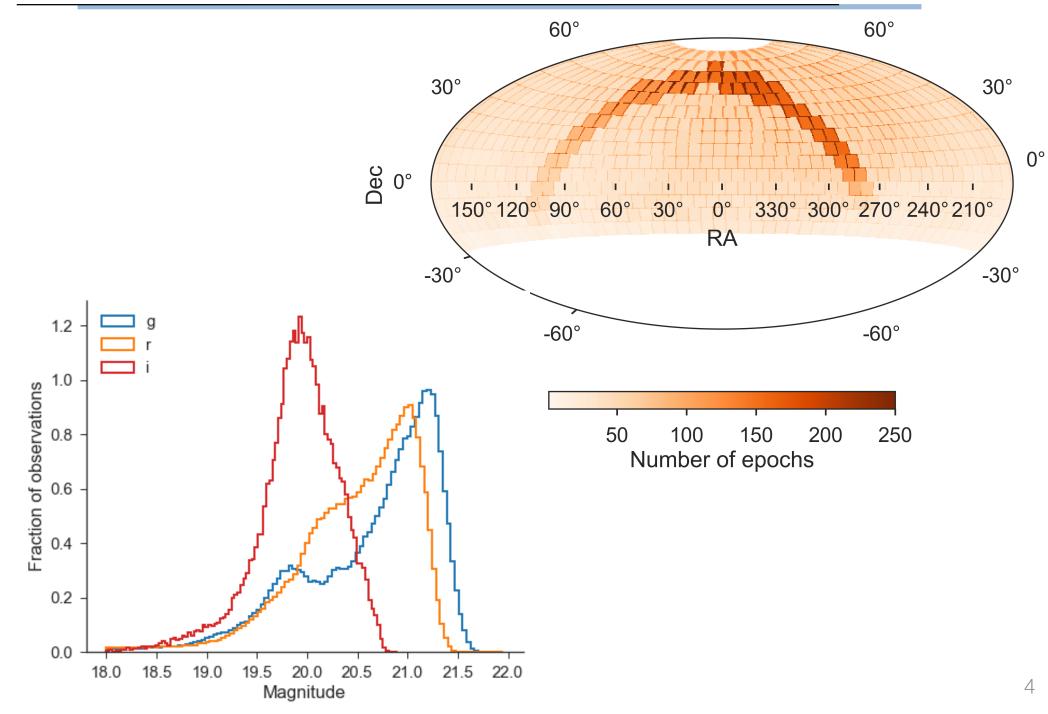
- Origins of and scientific motivations for the ZTF project
- Detailed system specifications
- Design of the camera and observing system
- Implementation of the data reduction pipelines and data archive
- Software tools developed to enable ZTF science, including the alert distribution system, machine learning classifiers, and web portals
- An overview of the planned ZTF surveys
- On-sky performance
- Expected scientific returns
- First scientific results

#### https://zwicky.tf/3w9



Credit: Caltech Optical Observatories

#### ZTF sources are well-matched for SDSS followup.



# ZTF is conducting an unusually large number of surveys simultaneously.

Program	Survey	Total Area	Cadence	
Public Surveys	Northern Sky Survey	23,675 deg <sup>2</sup>	3 day cadence 1 g, 1 r	
(MSIP; 40%)	Galactic Plane Survey	2800 deg <sup>2</sup>	1 day cadence 1 g, 1 r	
	Extragalactic High Cadence Survey	3000 deg <sup>2</sup>	4 day cadence 1 <i>i</i>	
ZTF Collaboration Surveys (40%)	<i>i</i> -band Survey	10,725 deg <sup>2</sup>	1 day cadence $3 g, 3 r$	
	Target of Opportunity	Varies	Varies	
	High-Cadence Plane Survey	~2100 deg <sup>2</sup>	> 2.5 hours continuous, <i>r</i>	
	Twilight Survey	N/A	4 r	
	Asteroid Rotation Survey	N/A	> 25 r	
Caltech TAC Surveys (20%)	Varies	Varies	Varies	

Maximize volume surveyed per image:

$$V = \frac{4\pi}{3} d^3$$

$$\propto 10^{0.6m_{\text{lim}}} \qquad \text{(to maximize SNR, use 10^{0.8m_{\text{lim}}})}$$

Limiting magnitude depends on: filter, sky brightness, airmass, seeing

# So: maximize the *volume-weighted* number of images observed in acceptable cadence windows.

Maximize volume surveyed per image:

 $V = \frac{4\pi}{3}d^3$  $\propto 10^{0.6m_{\text{lim}}}$ (to maximize SNR, use  $10^{0.8m_{\text{lim}}}$ ) Limiting magnitude depends on: filter, sky brightness, airmass, seeing objective function optimization algorithm So: maximize the volume-weighted number of images observed in acceptable cadence windows. observing strategy

#### A grid approach enables a nightly solution.

Request Sets (Fields)

#### **Time Blocks**

8

	to	t1	t2	t <sub>3</sub>	t4	t <sub>5</sub>	t <sub>6</sub>	t7
r <sub>o</sub> (gggg)								
r <sub>1</sub> (9999)								
r <sub>2</sub> ( <b>]r</b> )								
r <sub>3</sub> (gr)								
r4 (i)								
r <sub>5</sub> (grg)								
r <sub>6</sub> ( <b>r</b> g <b>r</b> )								

#### A grid approach enables a nightly solution.

#### Time Blocks

	t <sub>0</sub>	t1	t <sub>2</sub>	t <sub>3</sub>	t4	t <sub>5</sub>	t <sub>6</sub>	t7
r <sub>o</sub> (gggg)								
r <sub>1</sub> (gggg)								
r <sub>2</sub> (gr)								
r <sub>3</sub> ( <b>gr</b> )								
r4 (i)								
r <sub>5</sub> (grg)								
r <sub>6</sub> (rgr)								

# We use Integer Programming techniques to perform nightly optimization.

 $V_{rtf}$  Volume factor for request field r at time t in filter f  $Y_{rtf}$  ("yes") =1 if we observe r at t in f, 0 otherwise

maximize

$$\sum_{r \in R} \sum_{t \in T} \sum_{f \in F} V_{rtf} Y_{rtf}$$



subject to

$$\sum_{t \in T} Y_{rtf} \le n_{rf} \ \forall \ r \in R, f \in F$$

number of requests in this set

 $\sum_{r \in R} Y_{rtf} \le n_{\max} \ \forall \ t \in T$ 

number of observations in this slot

Bellm+ 2019b

And enforce one filter per slot + program balance

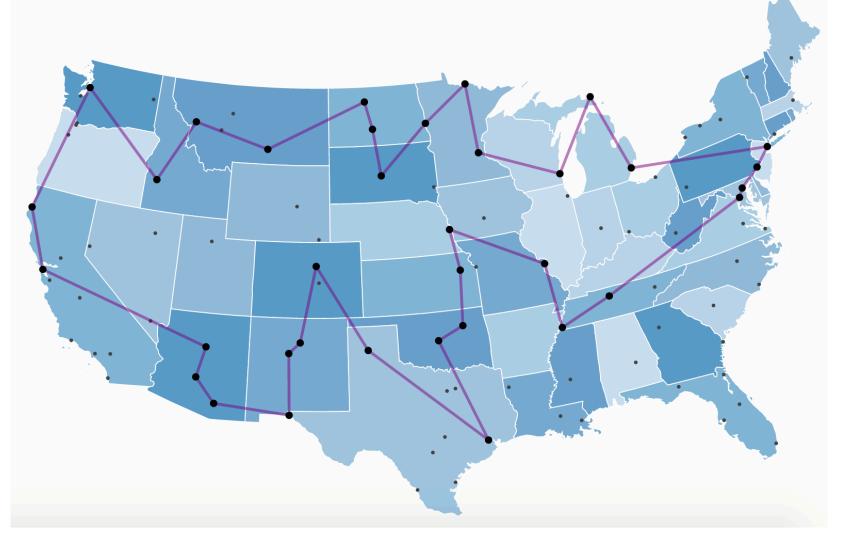
#### A grid approach enables a nightly solution.

**Time Blocks** 

		t <sub>0</sub>	t <sub>1</sub>	t <sub>2</sub>	t <sub>3</sub>	t4	t <sub>5</sub>	t <sub>6</sub>	t7
		g	r	g	g	i	g	g	r
r <sub>o</sub> (gggg)	Y <sub>0</sub> =1			Х	Х		Х	Х	
r <sub>1</sub> (gggg)	Y <sub>1</sub> =1	Х		Х	Х		Х		
r <sub>2</sub> (g <b>r</b> )	Y <sub>2</sub> =1							Х	
r <sub>3</sub> ( <b>]r</b> )	Y <sub>3</sub> =0								
r <sub>4</sub> (i)	Y4=1					Х			
r <sub>5</sub> (g <b>r</b> g)	Y <sub>5</sub> =1						Х	Х	Х
r <sub>6</sub> (rgr)	Y <sub>6</sub> =0								

#### Then we sequence each block by solving the TSP.

Distances defined by slew time between requests in this block.



HA and Declination slews don't change with slot, but dome slews do.

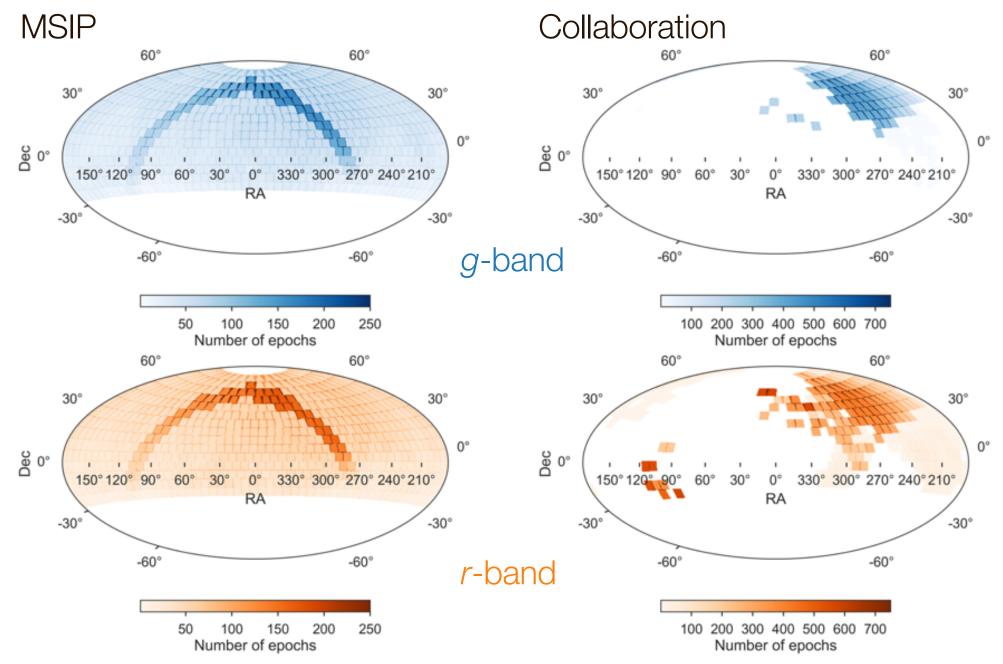
### Strengths:

obtains requested observations exactly maintains cadences uses lookahead to schedule observations for best conditions treats surveys uniformly maintains balance between programs minimizes slew time\*

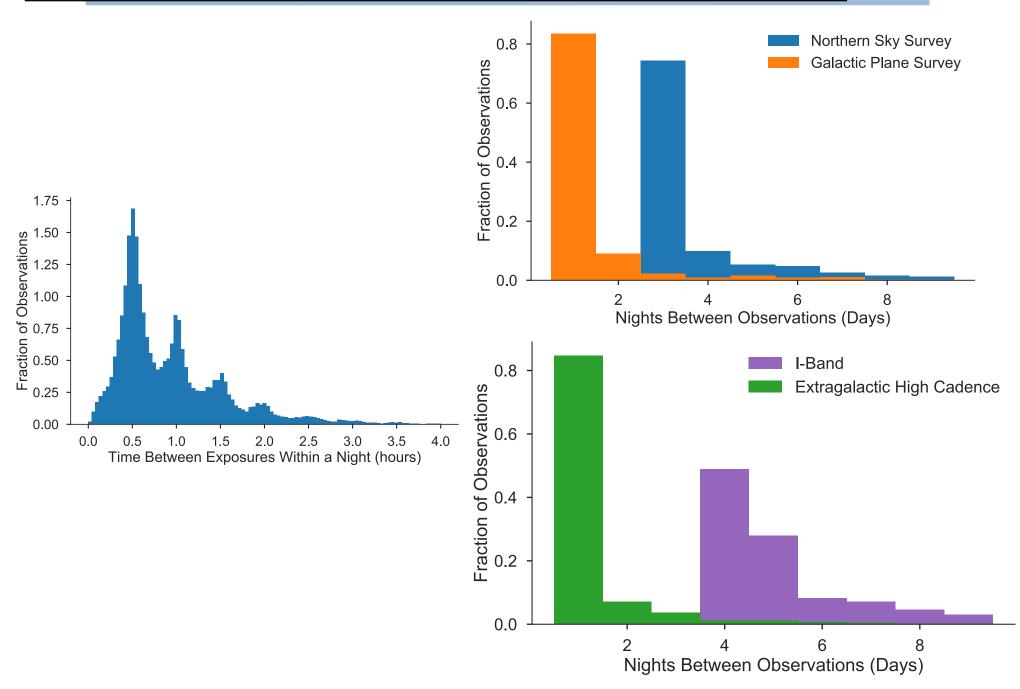
#### Weaknesses

cannot guarantee filter order within the night cannot enable specifying exact times between observations\* does not always fill all observing time does not (yet) dynamically adapt to clouds, seeing, etc.

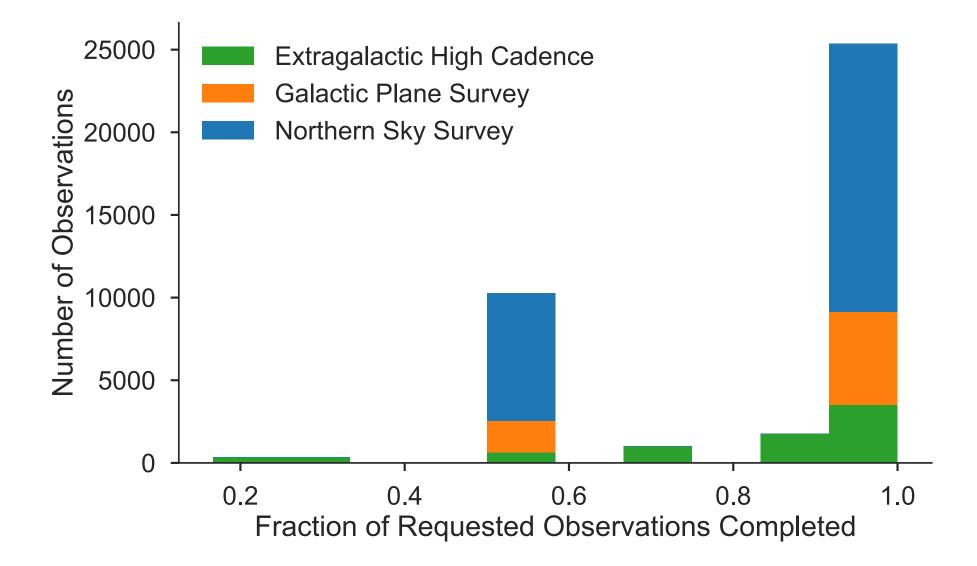
#### ZTF provides extensive coverage of the Northern sky.



# A variety of simultaneous observing programs can be conducted.



#### Sequence completion is very high.

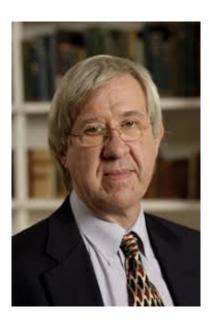


### ZTF II x SDSS V: The Fifth Paradigm?

### **Scientific Paradigms:**

- 1. Observation
- 2. Analytic Theory
- 3. Computational Science
- 4. Data-Intensive Science

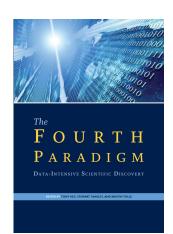
5. Algorithmically-Driven Science ("Self driving surveys")



Alex Szalay

#### What is Next?

- Artificial Intelligence in large-scale experimental design
- Example: Next Generation Astronomical Surveys
- Observing spectra is 10,000 times more expensive
- Prime Focus Spectrograph (Subaru telescope) following up on HSC
   Japan, USA, Germany, France, China, ...
- Use feedback from observed targets and continuously improve target selection algorithms through machine learning
  - Reinforcement learning with the telescope in the loop (project just starting at JHU and Princeton)
- Fifth Paradigm: when algorithms make the decisions about our experiments (not just driving our cars)?



ZTF is conducting a powerful time-domain survey across the Northern Hemisphere Sky, with hundreds of epochs yearly in three bands

Image depths make ZTF sources well-matched to SDSS-V followup

The ZTF scheduler can deliver multiple simultaneous timedomain surveys simultaneously

The future of surveys is algorithmic! Could ZTF-II and SDSS-V scheduling be coupled?

## Application of Machine Learning for Stellar Astronomy

By Jan van Roestel

#### Machine learning

"Machine learning" is a collection of methods (algorithms) that perform a function (classification, regression, clustering, ranking,...), but of instead of being programmed by a human, are optimized using the data itself.

Machine learning can be separated into two types:

#### 1. Supervised machine learning

A subset of the data is known (**'training data'**) and is used to create the ML-model. This is the most common type (in astronomy)

#### 2. Unsupervised machine learning

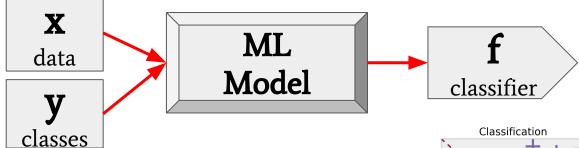
Nothing is known about the data; the ML-model is created from all data. Examples are principal component analysis (PCA), clustering, data-compression.

#### Supervised Machine Learning Classification

Function 'f', which maps input 'x' to 'y'.

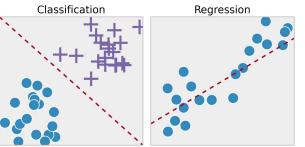


Supervised machine learning: use a known sample (x&y) to make 'f'



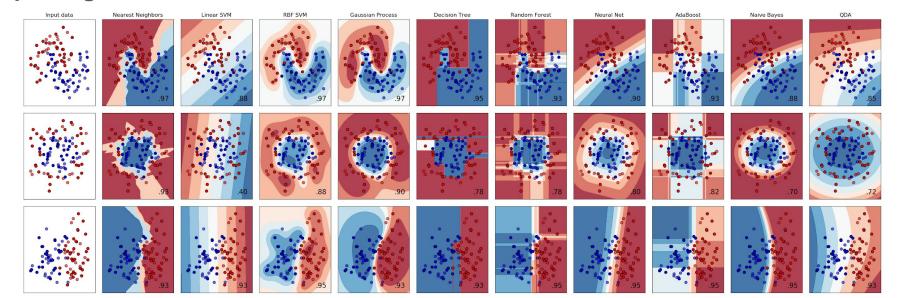
If y is discrete; a task is called 'classification'

If **y** is continuous; it is called **'regression'** 



#### A set of very flexible tools

Different types of machine learning methods exists. The choice of algorithm depends on the goal and type of input data, but also on how much it can be used as a black box. Many common algorithms are implemented in the **python package** <u>Scikit-learn</u>.



#### Two most popular algorithms: Random Forest

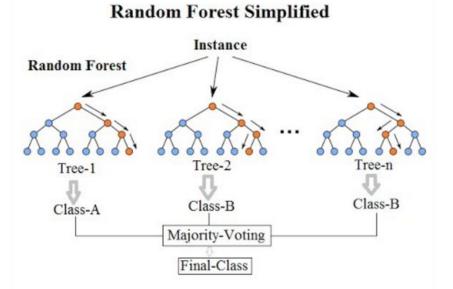
A collection of decision 'trees'

Advantages:

- Fast to train and apply
- Easy to understand
- Works out of the box
- Works with small data samples

Disadvantages

• Not very flexible



#### Two most popular algorithms: Neural Networks

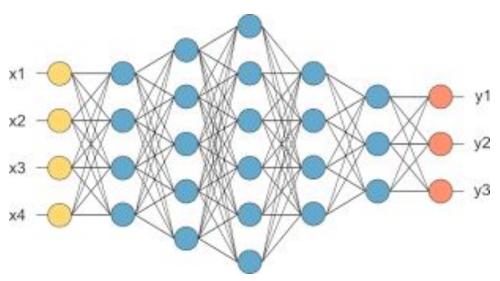
A set of connected 'neurons'

Advantages:

- Infinitely flexible: `neurons' can be connected in many different way
- Works with images, timeseries, video, ...

Disadvantages

- Deciding on the the right architecture is difficult
- Needs a lot of data to 'train'



#### When can machine learning be useful?

Machine learning has been very popular in the last few years. While it can do a lot of things, it is **not a silver bullet**. Typical problems were ML could be useful are:

- Task that a human can do in a split-second, but are hard to program.
- Tasks that take a (very) long time to compute can be approximated using ML methods.
- Any input data that hasn't been seen yet in the training set, machine learning cannot deal with.

#### Disadvantages of machine learning: 'BlackBox'

- Training data is required to construct the algorithms, which can be a challenge. In addition, training data needs to representative of the overall dataset.
- **Biases** and **completeness** can be difficult to quantify. This can be a problem when the output of machine learning methods are compared to predictions. For example; is the difference between the number of expected RR Lyrae stars versus what a ML-classifier finds an error in the prediction or the classifier?



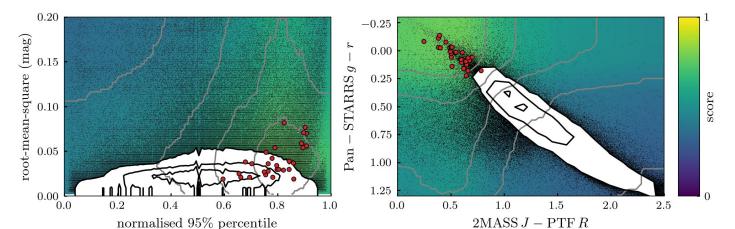
#### Examples of machine learning in stellar astronomy

#### Classification of variable stars

To classify variable stars, three types of information are used; variability, colour, and intrinsic luminosity.

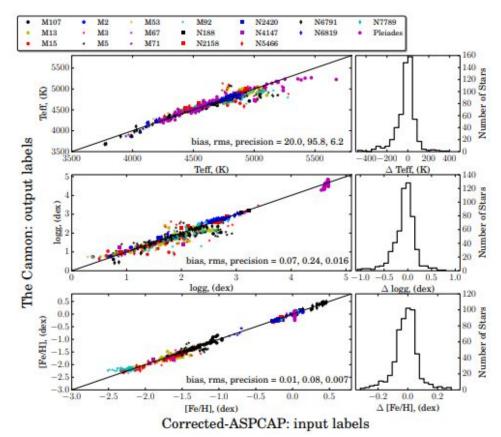
Typically, **lightcurve statistics** (median, RMS, period,...) are calculated, and combined with static colours and a parallax (or proper motion). These are then fed to a ML-classification algorithm (usually RandomForest). More advanced techniques which directly use the lightcurves are being <u>investigated</u>.

The figure below shows and example of how the ML-score depends on variability parameters (left) and colours (right). Examples: <u>Richards 2012</u>, <u>Pashchenko 2017</u>



#### Estimating stellar parameters from spectra

Ness et al 2017 developed a neural network that can quickly estimate stellar parameters (Temperature, surface gravity, [Fe/H]) from a 1D stellar spectrum. It is faster and more accurate than traditional model fitting approaches.



#### Faster modeling of physics of pulsating stars

Machine learning can also be used to **approximate physics simulations**.

For example, <u>Hendriks & Aerts</u> used a neural net to approximate stellar pulsations models (by <u>MESA</u> and <u>GYRE</u>). The neural net is used to find an approximate solution; **speeding up the 'fitting' process**.

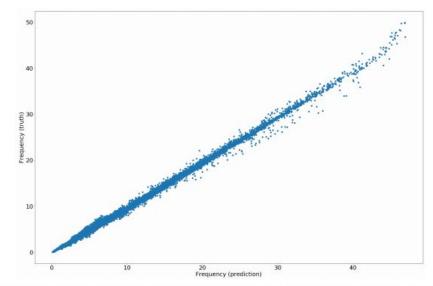
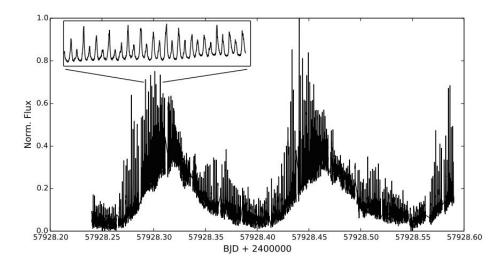


Figure 4. Visualization of the performance of the network. Plotted are the network predictions and the true values (from the dataset), for all stellar parameters and frequency modes. In this plot, 100,000 points from the validation data are shown.

Other examples are: <u>parameter estimation</u> of <u>eclipsing</u> <u>binaries</u> and determining the <u>internal structure of Red</u> <u>Giants</u>.

#### Remaining challenges for machine learning in astronomy

- Outlier and novelty detection (e.g. how to identify new types of objects/events?)
- Uncertainty propagation in data
- How to handle irregular time series directly (e.g. lightcurves)
- How to handle sparse datasets, and how to use informative missing data (limits)



#### Novelty detection is difficult:

AR Sco (white dwarf 'pulsar') has a unique lightcurve but was misclassified as a Delta Scuti variable in the 70s. In 2014, an amature astronomer noticed it's unique nature.