# **ZTF ML: Status & Plans**

	PCEB	RRab	EA_UP	ELL	Cep-II	RRd
						tpr35
EW	1.00 0.00 0.99 0.01	1.00 0.03 0.89 0.01	1.00 0.00 1.00 0.00	1.00 0.00 1.00 0.00	1.00 0.00 1.00 0.00	1.00 0.00 1.00 0.0
	0.99 0.01 0.98 0.02	0.35 0.64 0.37 0.63	0.38 0.62 0.64 0.36	1.00 0.00 1.00 0.00	0.90 0.10 0.90 0.10	0.66 0.34 0.67 0.3
	90669 - 85 abry_1abd	30999 - 2420 residuel_br_fe_ratio ald mad	S0598 – 108 residuel_br_fs_ratio	30693 – 142 nesiduat_br_ts_netio	90693 - 124 med	30593 - 500 residual_br_fs_ratio bel_tabl roms stopes_S0per
RS CVn	0.99 0.01 0.96 0.04	0.85 0.15 0.82 0.18	1.00 0.00 0.88 0.02	0.98 0.02 0.93 0.07	0.99 0.01 0.93 0.07	0.95 0.05 0.90 0.1
	0.85 0.16 0.80 0.20	0.05 0.94 0.10 0.90	0.04 0.96 0.15 0.85	0.66 0.46 0.72 0.28	0.51 0.49 0.58 0.42	0.18 0.82 0.26 0.7
	1614 - 86	1614 - 2420	1614 168	1614 - 142	1614 - 124	1614 - 500
	idopiec_10pier	stetson_t med	<del>(</del> #20	марык_10ры	steixon_)	stetson_1 stetson_1
beta Lyrae	0.95 0.06 0.97 0.08	0.85 0.14 0.87 0.13	0.62 0.08 0.63 0.07	0.95 0.06 0.96 0.05	0.95 0.06 0.92 0.08	0.93 0.07 0.94 0.1
	0.18 0.82 0.28 0.72	0.00 1.00 0.01 0.99	0.10 0.90 0.10 0.90	0.07 0.98 0.12 0.88	0.11 0.89 0.14 0.96	0.01 0.99 0.03 0.
	279 ~ 85 bel_fand residual_br_fa_ratio	279 × 2430 bel_fetd residual_br_fa_ratio med	279 ~ 153 statson_K residua_br_ta_ratio	279 ~ 142 bel_fabd residual_br_fa_ratio	279 ~ 124 bel_1etd	279 × 500 residual_br_fs_ratio bol_1std ak
RRo	1.00 0.00 1.00 0.00	0.91 0.09 0.88 0.12	1.00 0.00 1.00 0.00	0.99 0.01 0.99 0.01	1.00 0.00 0.96 0.05	0.99 0.01 0.93 0.1
	0.91 0.09 0.84 0.16	0.25 0.75 0.45 0.55	0.08 0.97 0.09 0.91	0.94 0.06 0.96 0.05	0.84 0.16 0.80 0.20	0.76 0.24 0.93 0.
	5453 ~ 85 shataon_l roms	5433 ~ 2420 stetson_t	5433 ~ 153 <b>tyr6</b> 5	5433 ~ 142 statison_J mad	5433 ~ 124 stataon_J	5433 ~ 500 slopes_10per
PCEB	8.00 1.00 6.00 1.00	0.09 0.91 0.10 0.90	0.83 0.07 0.87 0.13	0.57 0.43 0.57 0.43	0.82 0.38 0.88 0.32	0.87 0.33 0.64 0.3
	0.00 1.00 0.00 1.00	0.00 1.00 0.03 0.97	0.06 0.95 0.04 0.96	0.08 0.92 0.14 0.86	0.11 0.59 0.16 0.84	0.03 0.97 0.06 0.5
	85 – 47675 nexidual_br_fa_retio	85 - 2420 med	86 - 163 residual_br_fa_ratio	85 - 142 statison_l slopes_10per for65	85 – 124 stetson_) fpr80 stopps_10ppr	86 – 600 stetson_1 stetson_1

### Ashish Mahabal ZTF Team Meeting 2018-03-20











DESY



• Los Alamos





# Outline

- Overview (current and plans)
- Real-Bogus Umaa Rebbapragada (part II)
- Real-Bogus using Deep Learning Brian Bue (part III)

# Many contributions

- Richard Walters: Zooniverse setup and campaigns UW
- Frank: Access to ZTF products
- Nadia: TNS comparisons
- Ragnhild: Connection to Transient marshal AMPEL
- Umaa/Brian: R-B classification
  - Adam Miller: Star-galaxy separation
  - Quan-Zhi Ye: streaking asteroids

**Enabling some activities:** 

- Shri
- Dmitry Duev
- Suvi
- Matthew Graham
- Mansi
- Tom Prince
- • •

Join ZTF ML mailing list meetings: alternate Wednesdays (9 AM), Thursdays (2 PM) http://noir.caltech.edu/twiki\_ptf/bin/viewauth/ZTF/MachineLearning

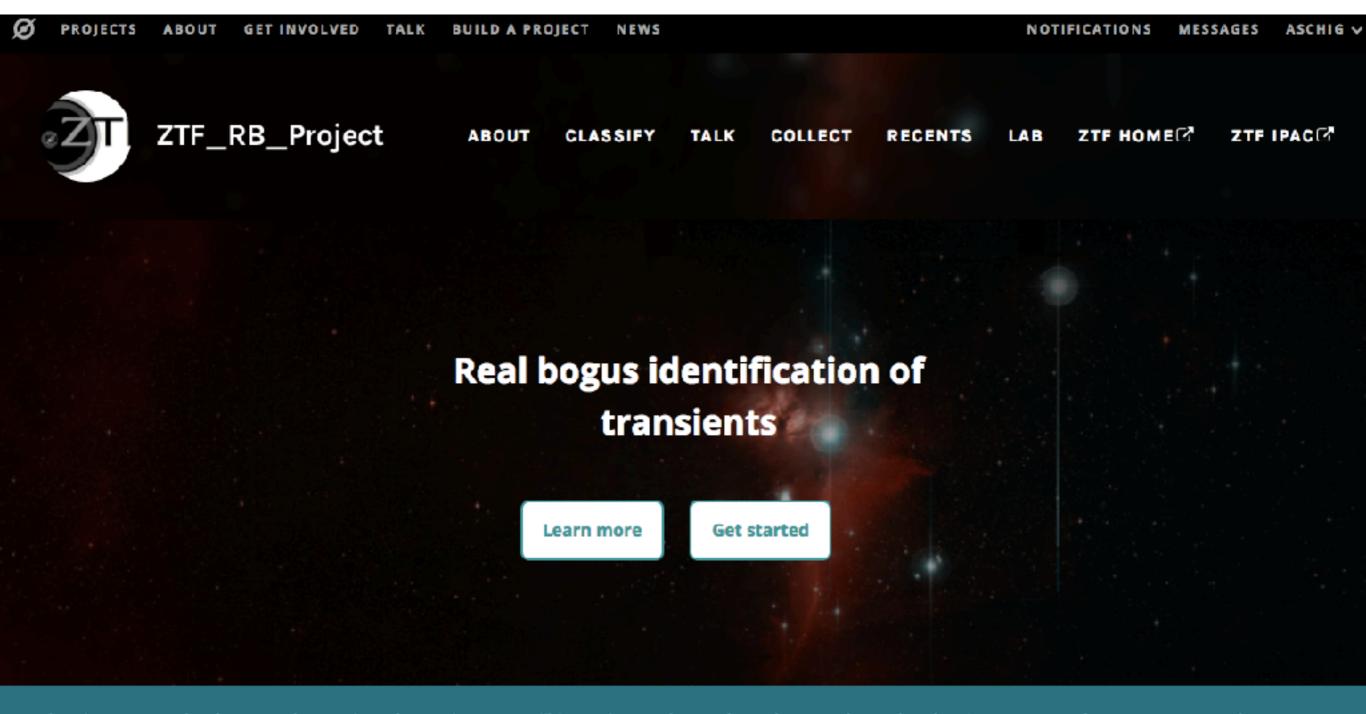
Students:

- Tiara Hung
- Yutaro Tachibana
- Charlotte Ward

I am sure I have missed some names

## Help Wanted

#### **Zooniverse Starting Screen**



This project has been built using the Zooniverse Project Builder but is not yet an official Zooniverse project. Quaries and issues relating to this project directed at the Zooniverse Team may not receive any response.



1 person is talking about

### Start with the tutorial

REF Metadata Definitions magpsf = Magnitude of object in science image

\_RB\_Project

null

ABO

19.04 0.04 0.98 -999 nan

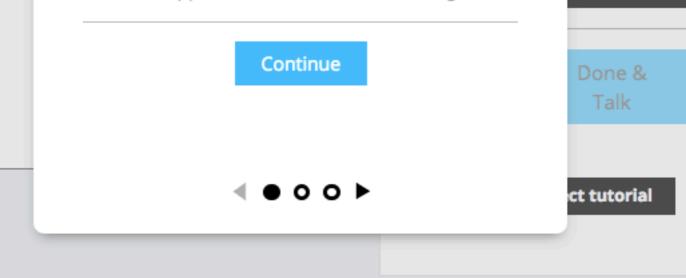
- sigmapsf = Error of magnitude in science image
- classtar = Likelihood of object being a star with 1 being highest and 0 the lowest (source Sextractor)
- ssdistnr = Distance to nearest solar system object
- sgscore = Star galaxy score (Not automated yet)
- nneg =
- nbad =
- rb = Real bogus score (Not automated yet)

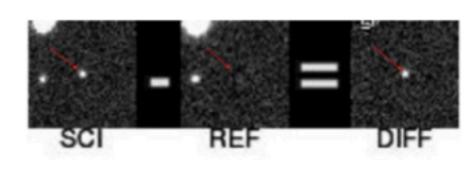
Let's go!

S/N = Signal to noise of science object

The subtraction above is an example of a real

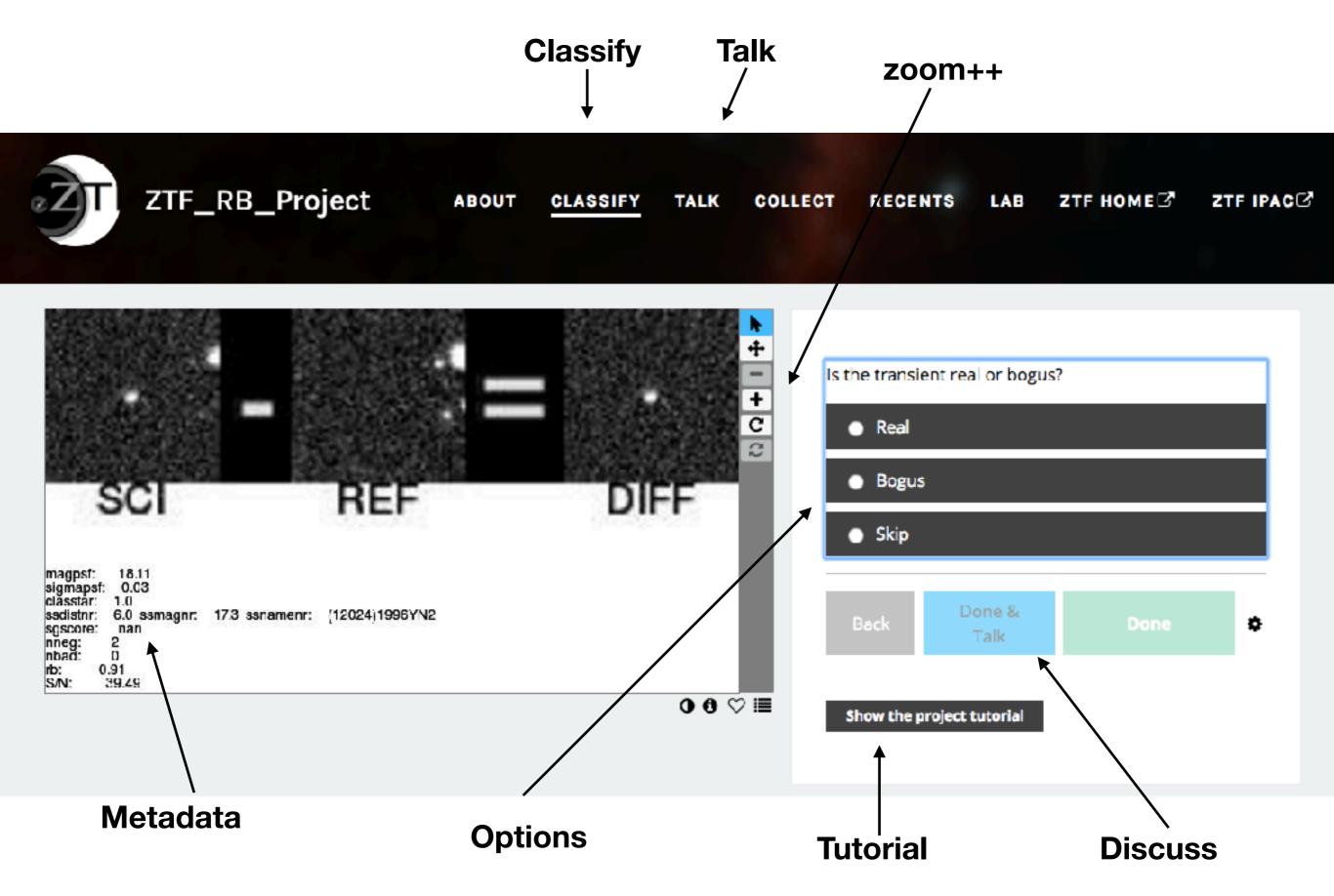
transient and should be classified as such. The transient appears at the center of the image.

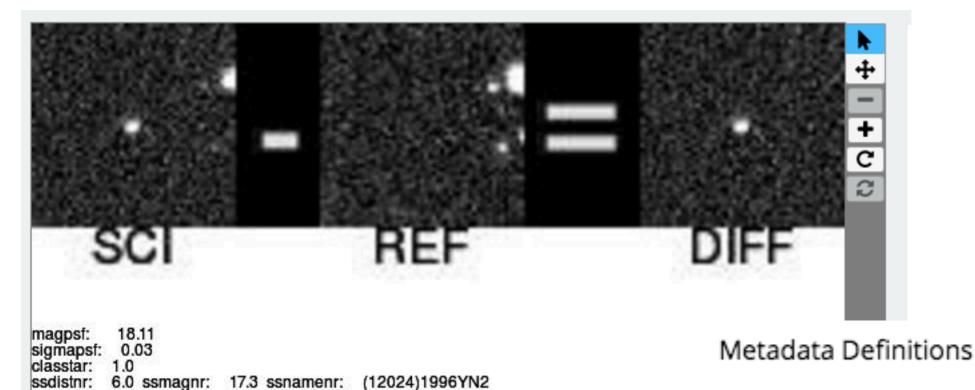




real or bogue

### Individual classification pages





- magpsf = Magnitude of object in science image
- sigmapsf = Error of magnitude in science image
- classtar = Likelihood of object being a star with 1 being highest and 0 the lowest (source Sextractor)
- ssdistnr = Distance to nearest solar system object
- sgscore = Star galaxy score (Not automated yet)
- nneg =
- nbad =
- rb = Real bogus score (Not automated yet)
- S/N = Signal to noise of science object

magpsf

sgscore:

nneg: nbad:

rb:

S/N:

nan

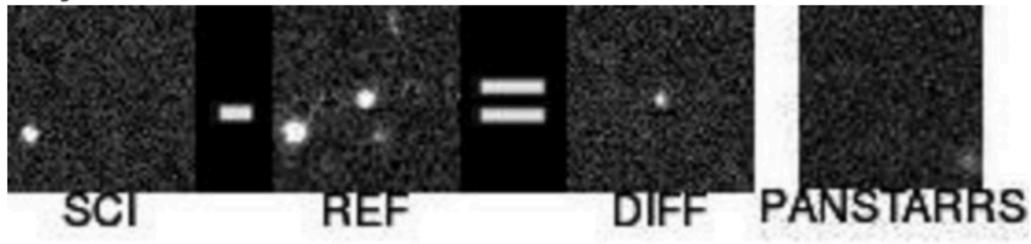
39.49

20

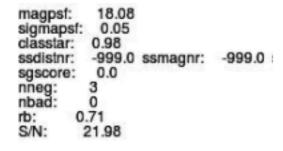
0.91

- rb (real-bogus)
- sgscore
- ssdistnr

### Subject 19734239



#### Comments:





#### March 15th 2018, 9:28 am

Yes that happens when isdiffpos parameter of the ZTF package is equal to 0 or 'f'. For these cases in the DIFF image we are actually looking at REF-SCI.

I think this is a variable star or moving object that happened to enter the reference image.

For Zooinverse vetting it might be better to remove isdiffpos==0 sources.

Q View the discussion

#### March 14th 2018, 2:42 pm

Indeed, it does seem like a negative subtraction. But in the diff it seems positive!

Q View the discussion

Q View the discussion

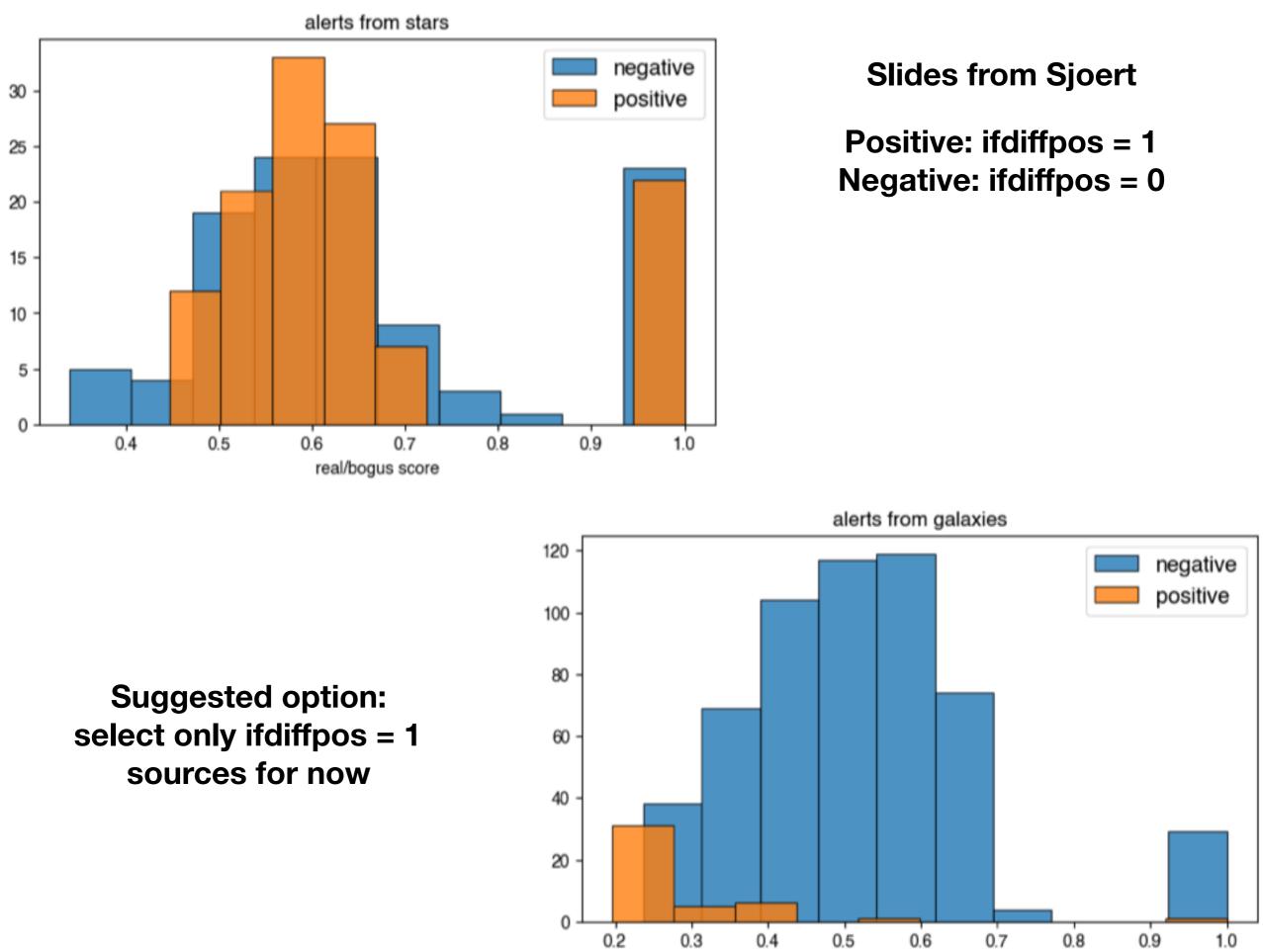
March 8th 2018, 3:30 pm

another negative subtraction? For non-expert users this could be confusing? perhaps selected only source with isdiffpos=1?

ifdiffpos keyword



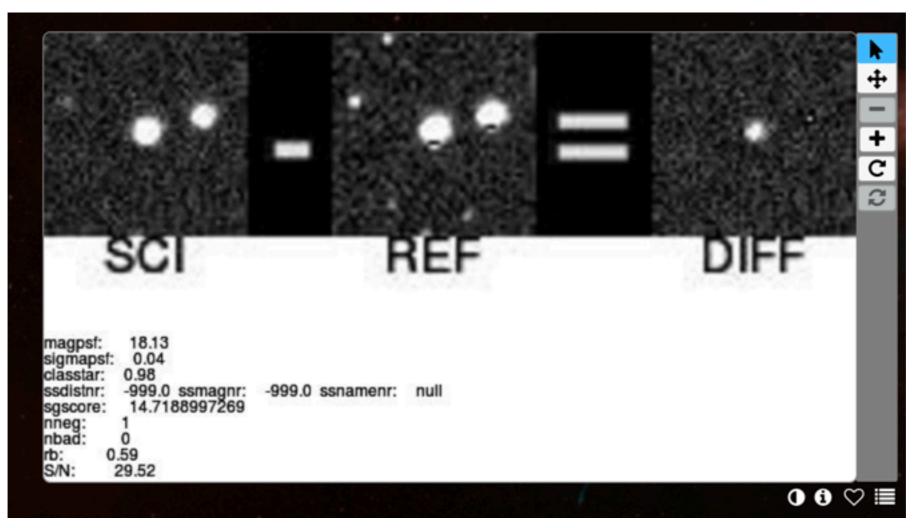




real/bogus score

# Other suggestions

Nadia



Point out bad Ref images Can be done in "Talk"

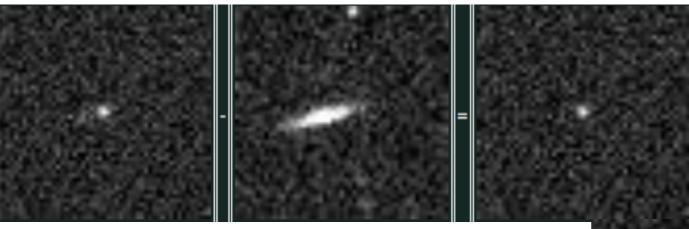
+other, mainly for reals. To be taken up later.

# **Question of Completeness**

- High SNR selection: Are we losing good sources?
- Can be checked with known asteroids of fainter mags

Diff

- Also sources detected by other surveys
- Separability of real-bogus may be linked



Sci

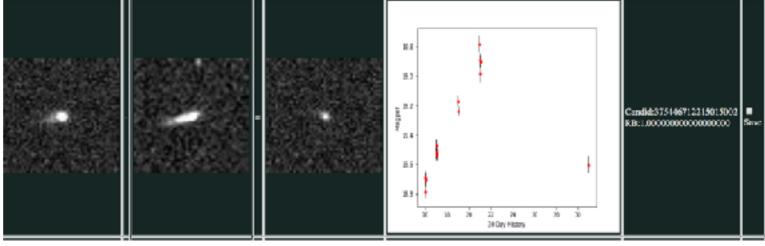




# **TNS Verification**

Nadia Blagorodnova

- Cross-match of TNS reported transients with ZTF alerts
  - 59 TNS objects identified in ZTF alerts (467 alerts with repeats)
- Search for TNS objects not in ZTF alerts
  - 802 TNS objects in fields observed by ZTF without identification in ZTF
  - 78 observed in ZTF at epochs +/- 2 days of the discovery date
  - 51 have, at discovery 15 < mag < 20
  - 38 no reference images before the ZTF observations
  - 13 missed (investigation ongoing... object in reference, other...)

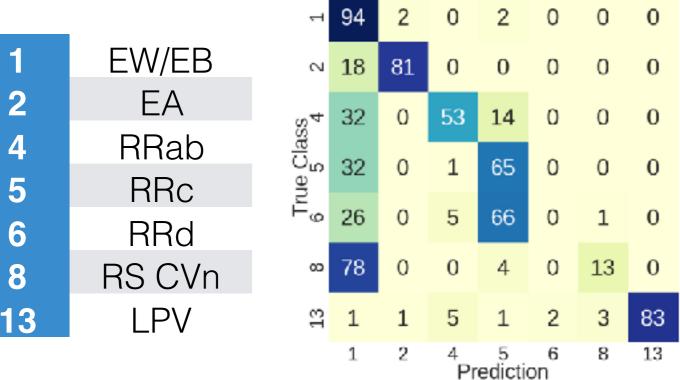


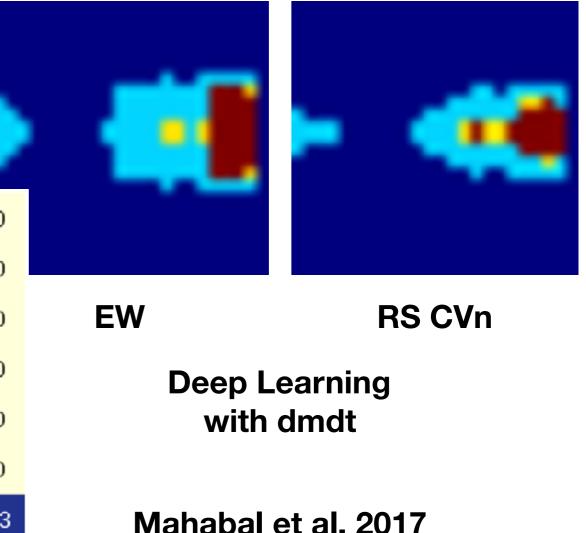
# **RB Campaign Planning**

- delta-t > 30 mins; ndet >= 2
- In the past:
  - just i-band
  - 0.2 < RB; 0.4 < RB < 0.6; RB >0.9
- Planning further campaigns
  - e.g. By science goal; by CCD; by x and y
  - Thu. 9 AM, Cahill #370

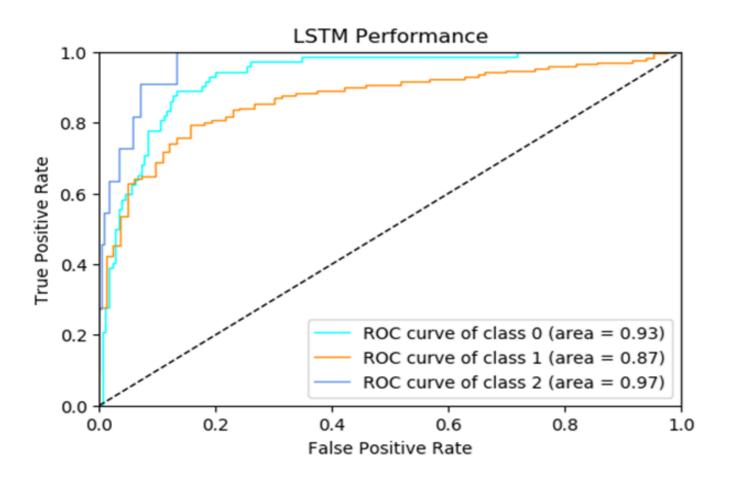
## **Real-Real classification**

- Move away from explosions-only mode
  - Current reals may be biased away from extragalactic
  - Need 'Archive Marshal' volunteers to mark reals too
- Random Forests (true/trusted)
- Deep learning (with images)





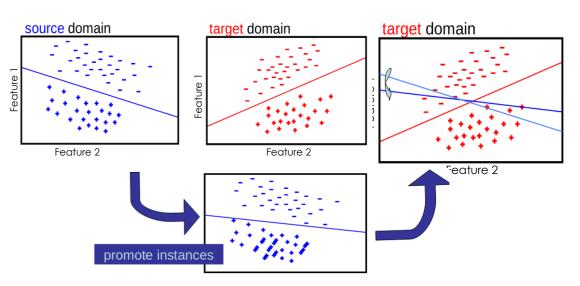
# **Real Real with Light Curves**



### CRTS transients With Sreyasee Das, VIFI

Using light curves (with mag err)

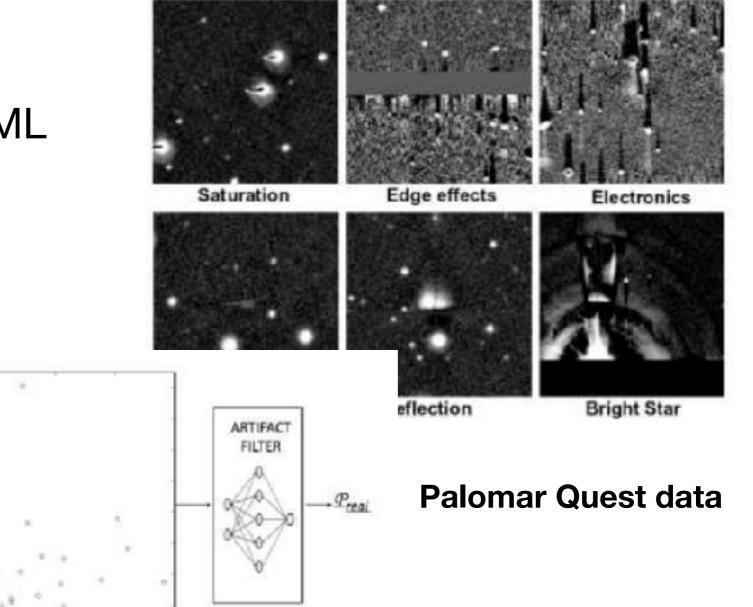
### **Domain adaptation**



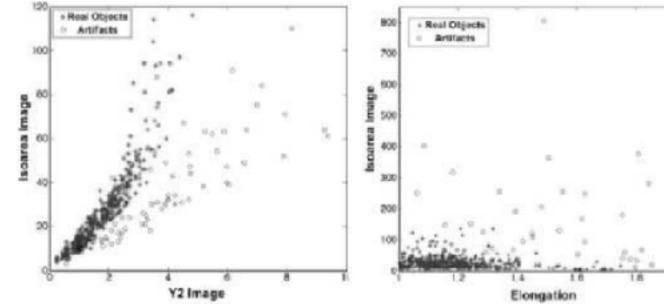
### CRTS, PTF -> ZTF

## **Bogus Bogus**

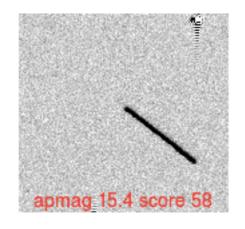
- Will help us understand our contaminants better
- Somewhat lower priority (i.e. not at the expense of science)
- Use of Zooniverse + ML

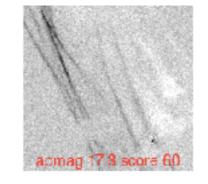


### Donalek et al. 2008



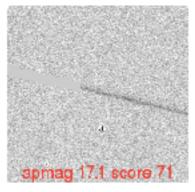
## **Deep Learning with AStreaks**





These are ghosts and dementors

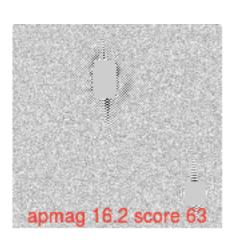
This is how a real asteroid would look. Short streak.



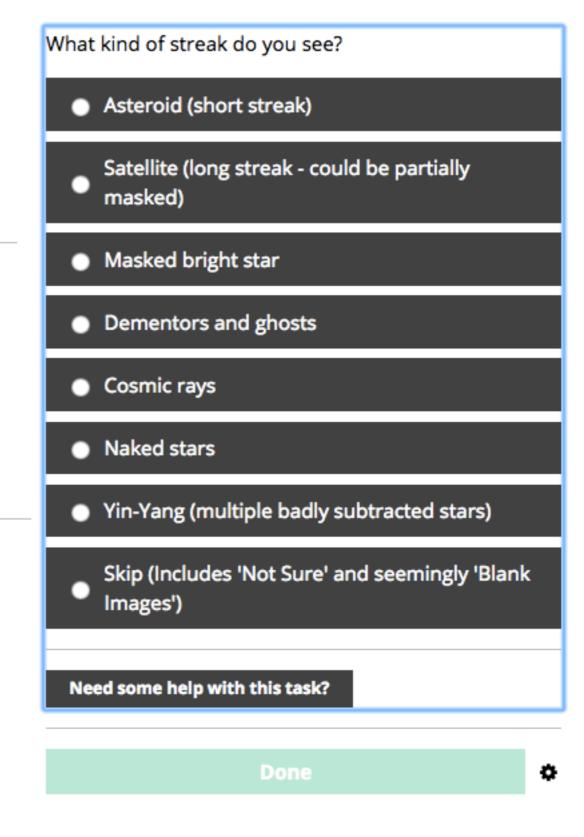
A satellite trail. Note that part of it is masked out, and the unmasked trail is longer.



Another satellite trail



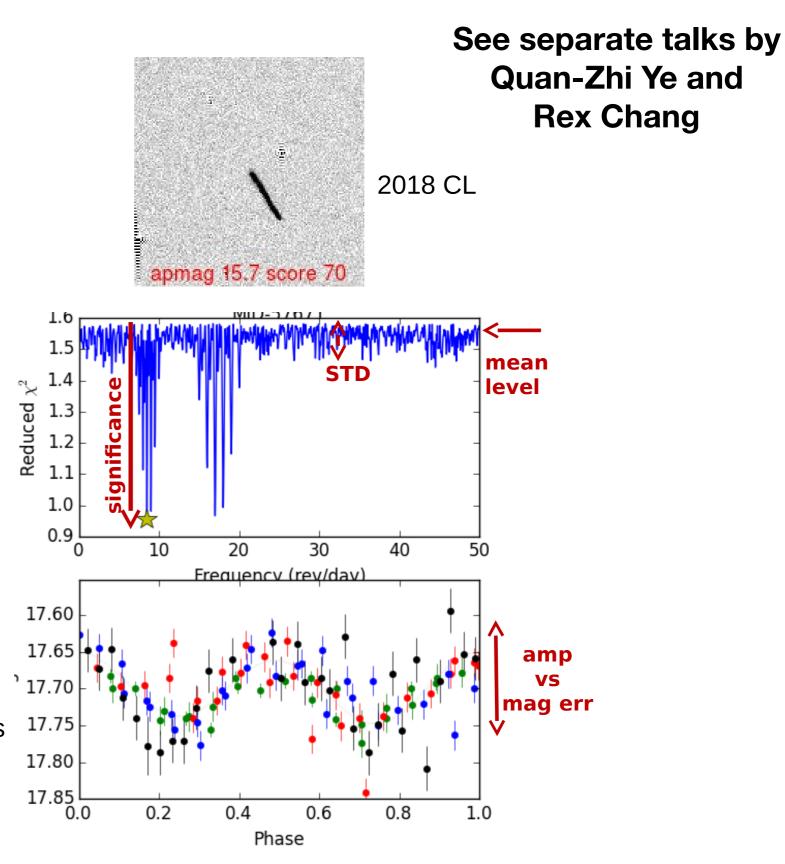
A masked bright star



#### Show the project tutorial

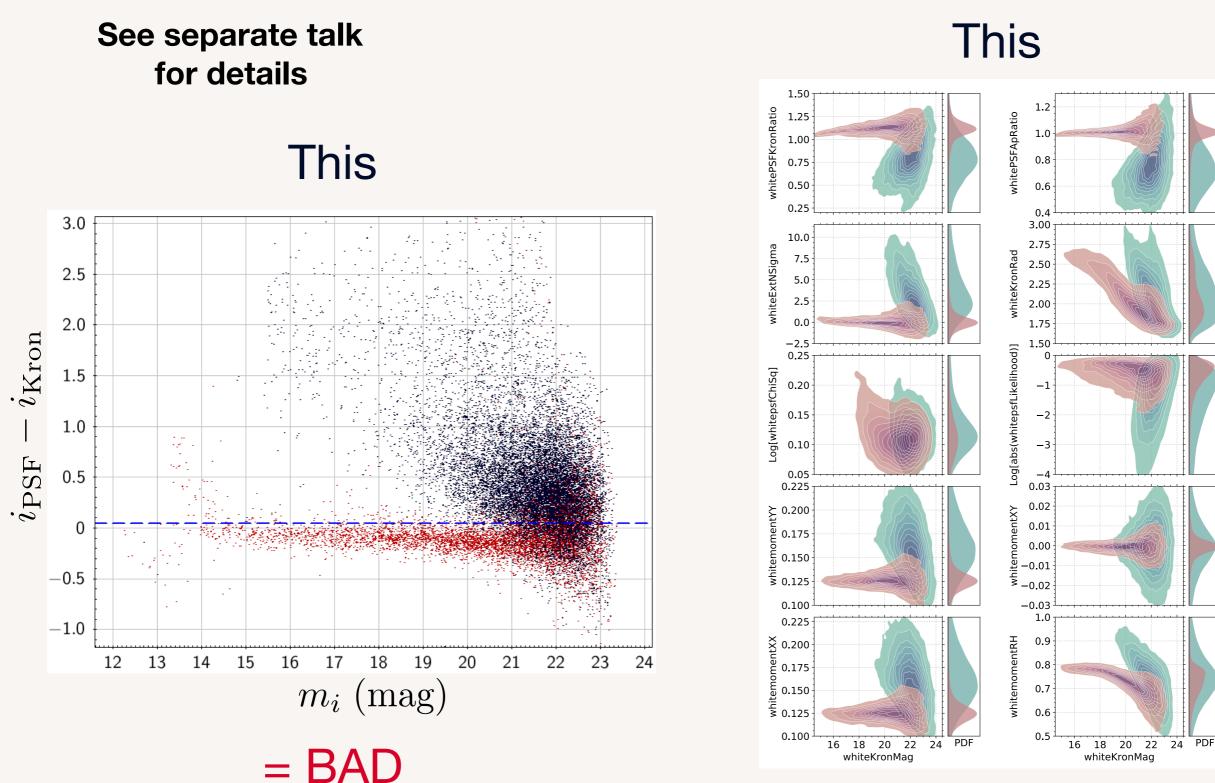
# ML effort in solar system science

- Streak detection (lead by QZ Ye/Caltech)
  - Based on Random Forest; using synthetic data + ZTF images as input
  - Several ML model "flavors" exist and under test
  - Working on building a better RB classifier
- Rotation period determination (lead by Rex Chang/NCU)
  - Based on Random Forest; using PTF data as input
  - Working on tunning the parameters in order to pick out the most interesting cases



## **Star-Galaxy Model**

### **Adam Miller**



= also not good (but waaaay better)

# Connecting with brokers

- ALeRCE
- AMPEL



• Antares

# Help Welcome

Hope to see many of you on Thursday at 9 AM in #370

Join ZTF ML mailing list meetings: alternate Wednesdays (9 AM), Thursdays (2 PM) http://noir.caltech.edu/twiki\_ptf/bin/viewauth/ZTF/MachineLearning

