CTA's webinars

# SYNERGIES IN THE EXPLORATION OF THE EXTREME UNIVERSE

for researchers



"Alert Brokers for Astrophysical Surveys: What is in it for CTA and how to engage"

#### **Gautham Narayan**

Assistant Professor at the University of Illinois at Urbana-Champaign Deputy Analysis Coordinator of the Rubin Observatory's Dark Energy Science Collaboration

# 1. HOW ASTROPHYSICAL SURVEYS ARE EVOLVING

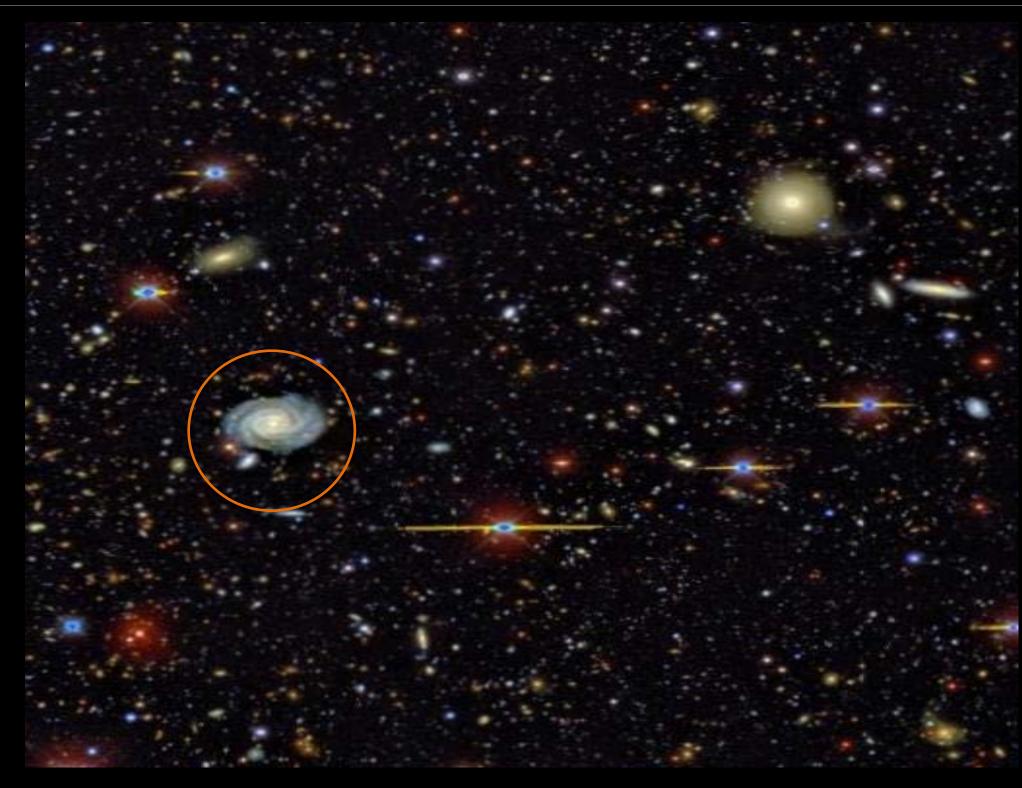
#### < 2000 PHOTOGRAPHIC PLATES



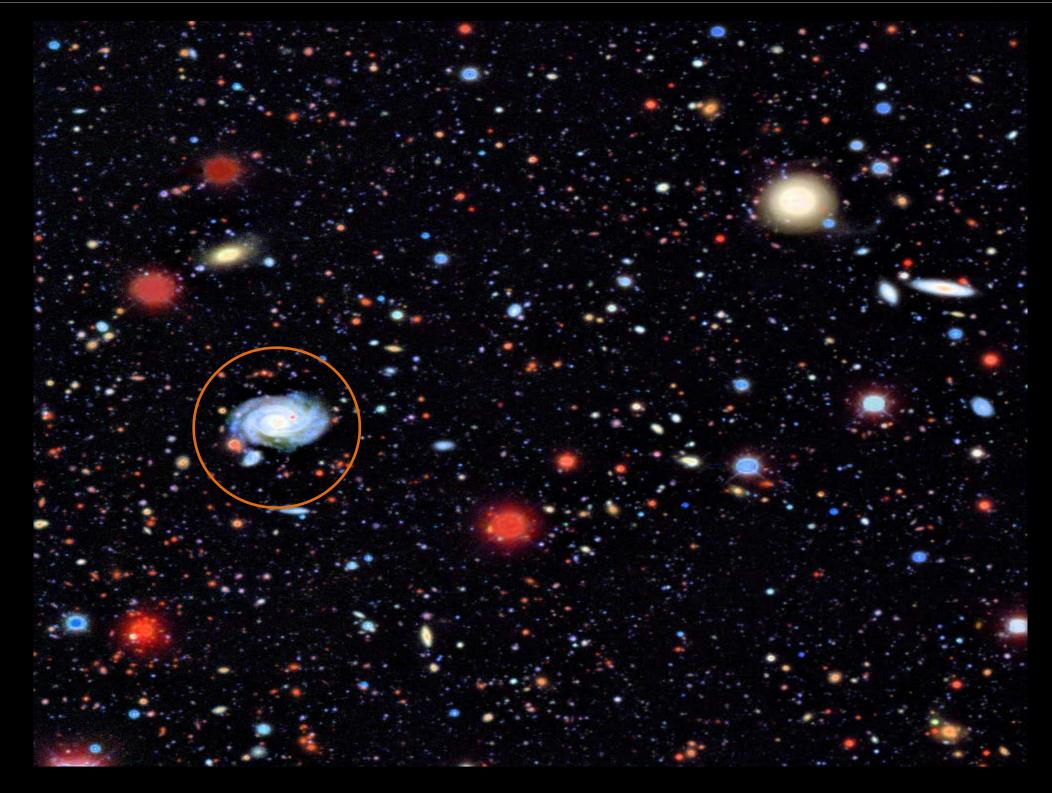
#### 2000 - 2018+ DIGITAL SKY SURVEY



#### 2001 - 2006 DEEP LENS SURVEY



#### > 2021 LEGACY SURVEY OF SPACE AND TIME



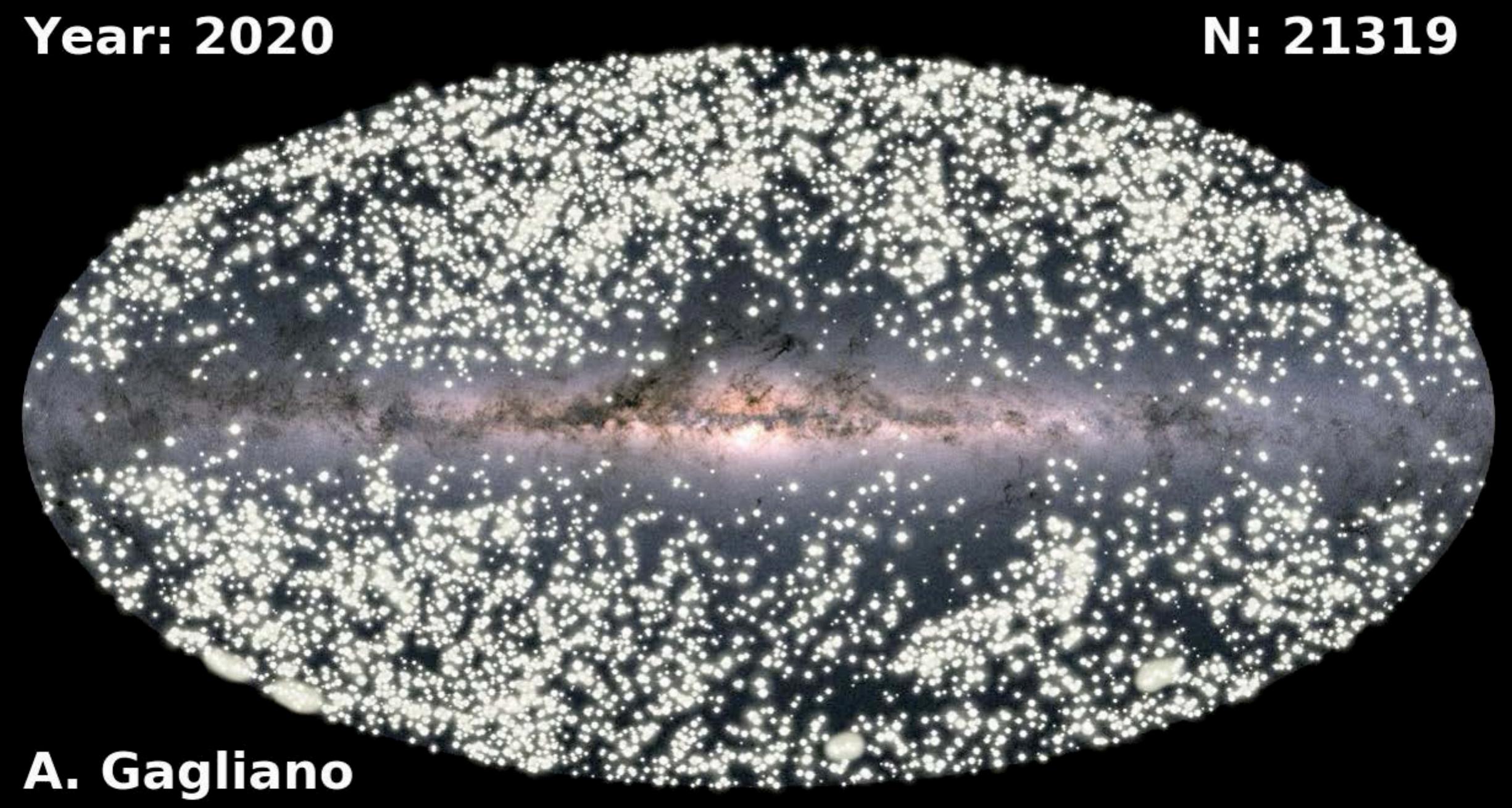
37 billion stars and galaxies (10 year survey)

10 million alerts, 1000 pairs of exposures/night



THIS IS WHAT THE DATA LOOK LIKE WHEN YOU SUBTRACT AWAY MOST OF IT

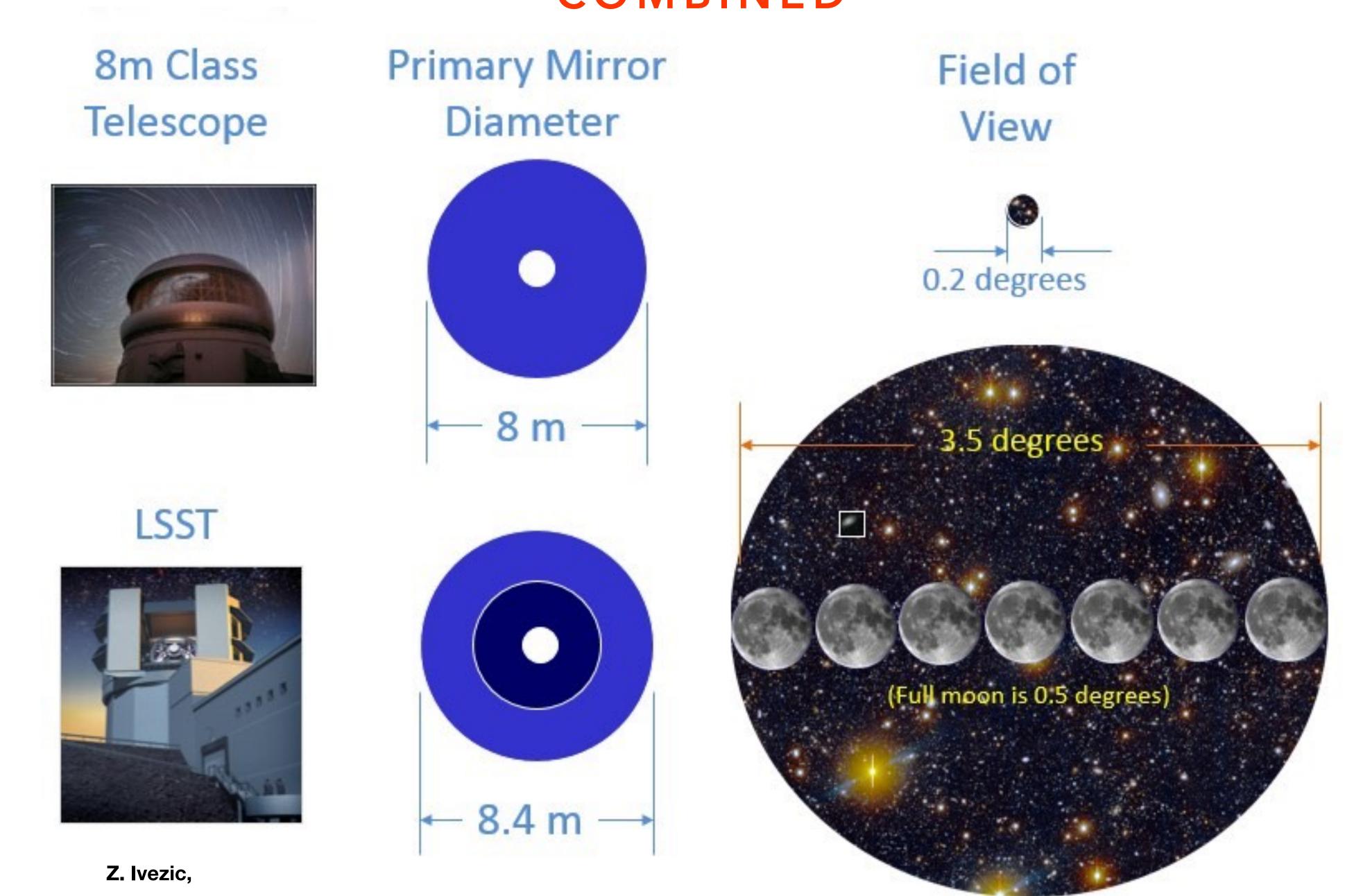
# THIS IS THE CORE OF AN ALERT

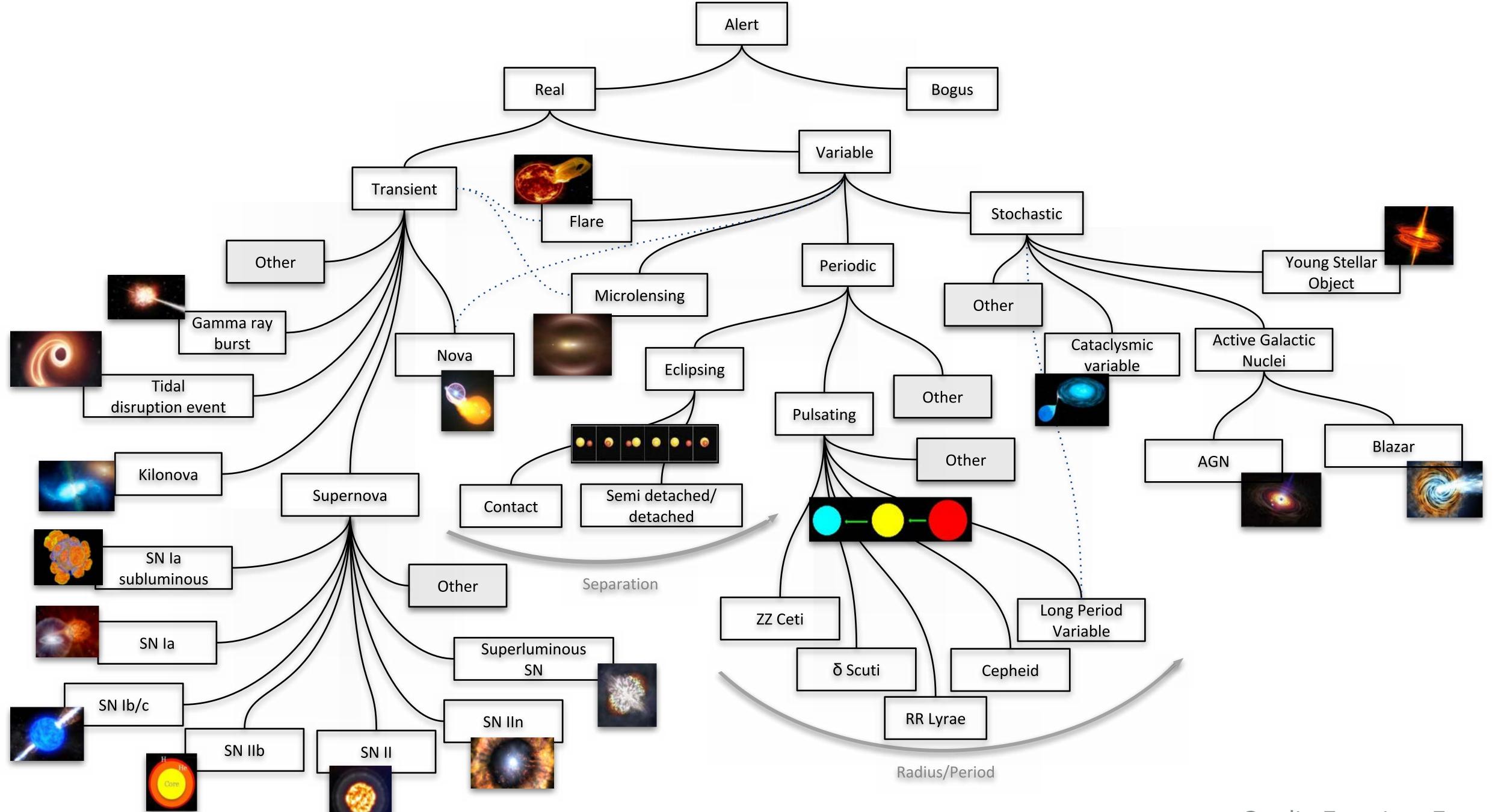


#### A. Gagliano

LSST watches the changing sky, discovering the deaths of stars

# LSST'S ALERT RATE OUTSTRIPS ALL OUR FOLLOWUP RESOURCES - COMBINED





# The Bulk of LSST alerts users will be LSST DESC, TVSSC and AGNSC (in that order)



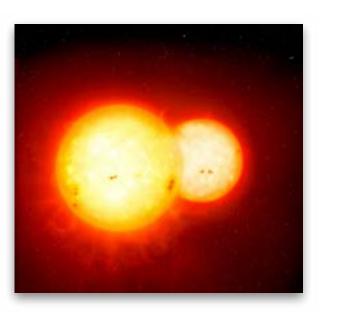
#### **Transients**

Rapid photometric & spectroscopic follow-up: nature of the progenitors (outermost layers) & explosion physics (ejecta structure).

**Short-lived transients** (GWs, GRBs)

Cosmological distance rulers.

Rare populations of events?



#### Variable stars

Rapid photometric & spectroscopic follow up: low mass microlensing events, changing mode stellar pulsators, rapid reaction to eclipsing events, eruptive events

Analysis of large populations of events: study Milky Way structure & formation.

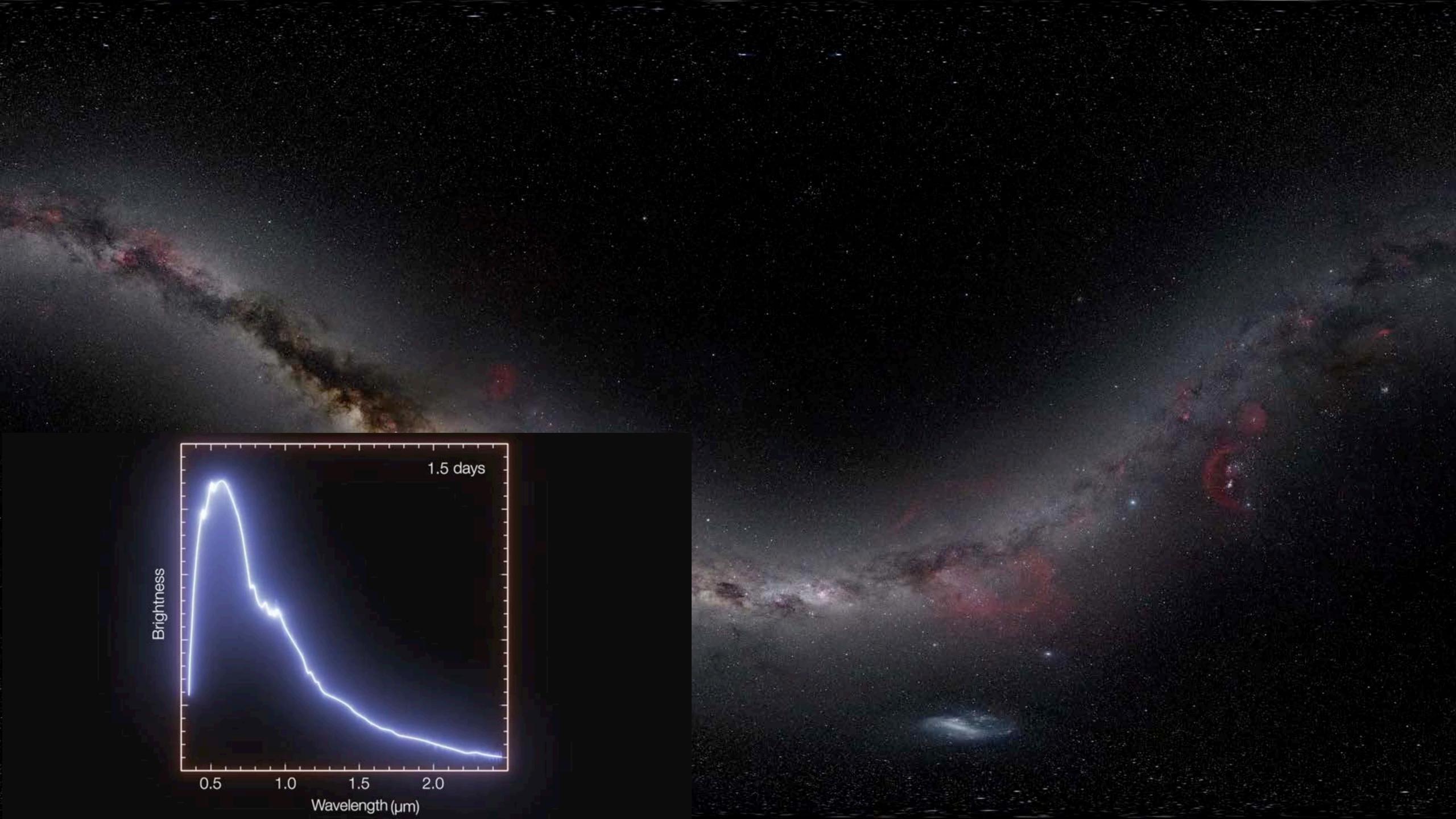


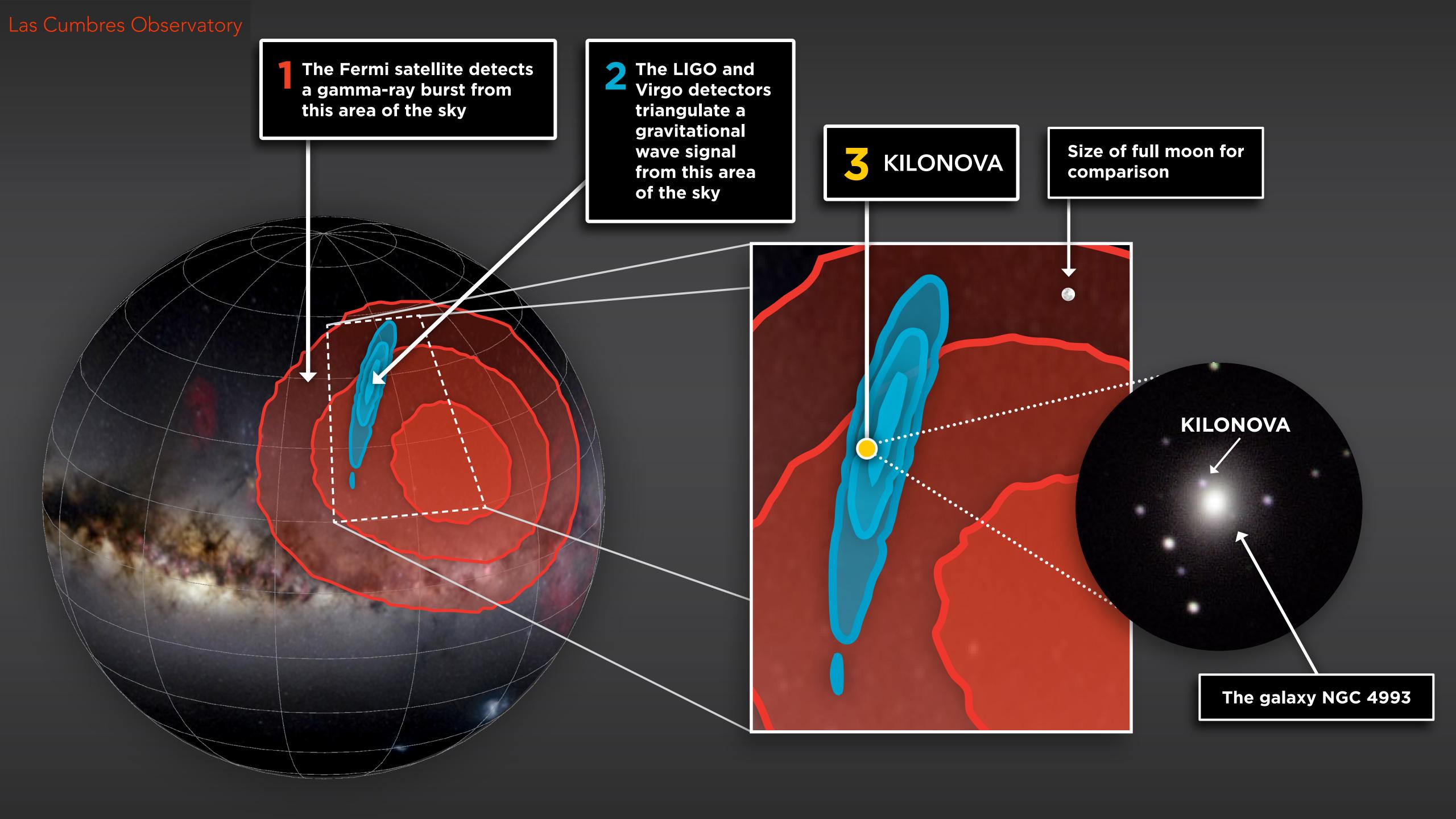
#### **Active Galactic Nuclei**

Rapid photometric & spectroscopic follow-up: changing look AGNs, reverberation mapping studies

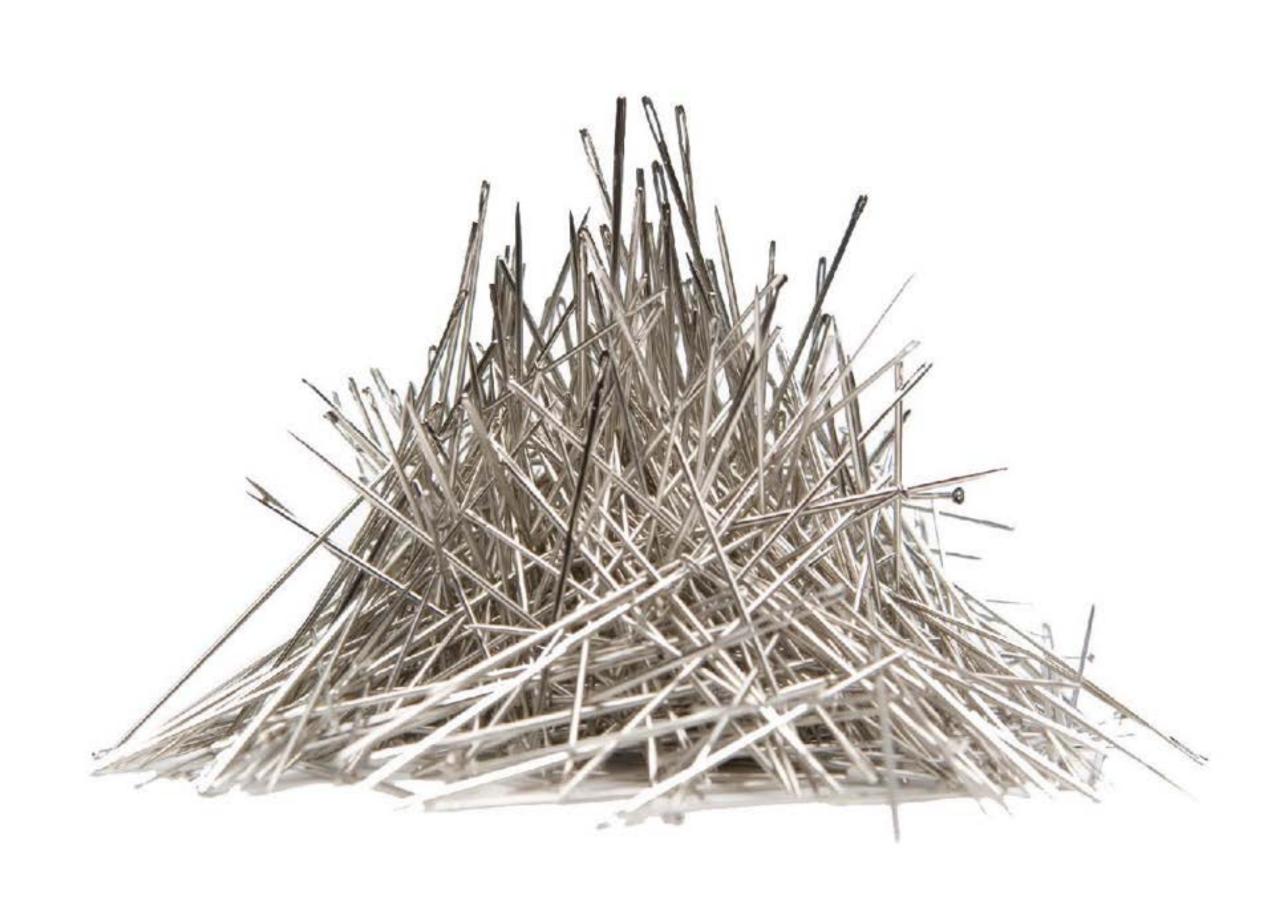
New populations of **faster**, **redder**, **dimmer** AGNs

Detection of intermediate mass black holes, tidal disruption events





## RARE AND INTERESTING TRANSIENTS IN THE ALERT STREAM: NEEDLE IN A NEEDLESTACK





#### **HST Search Results**

Edit Query

Object name M100 resolved by NED (via SANTA cache) to MESSIER 100 (G) RA: 12 22 54.83 Dec: 15 49 18.55 (J2000)

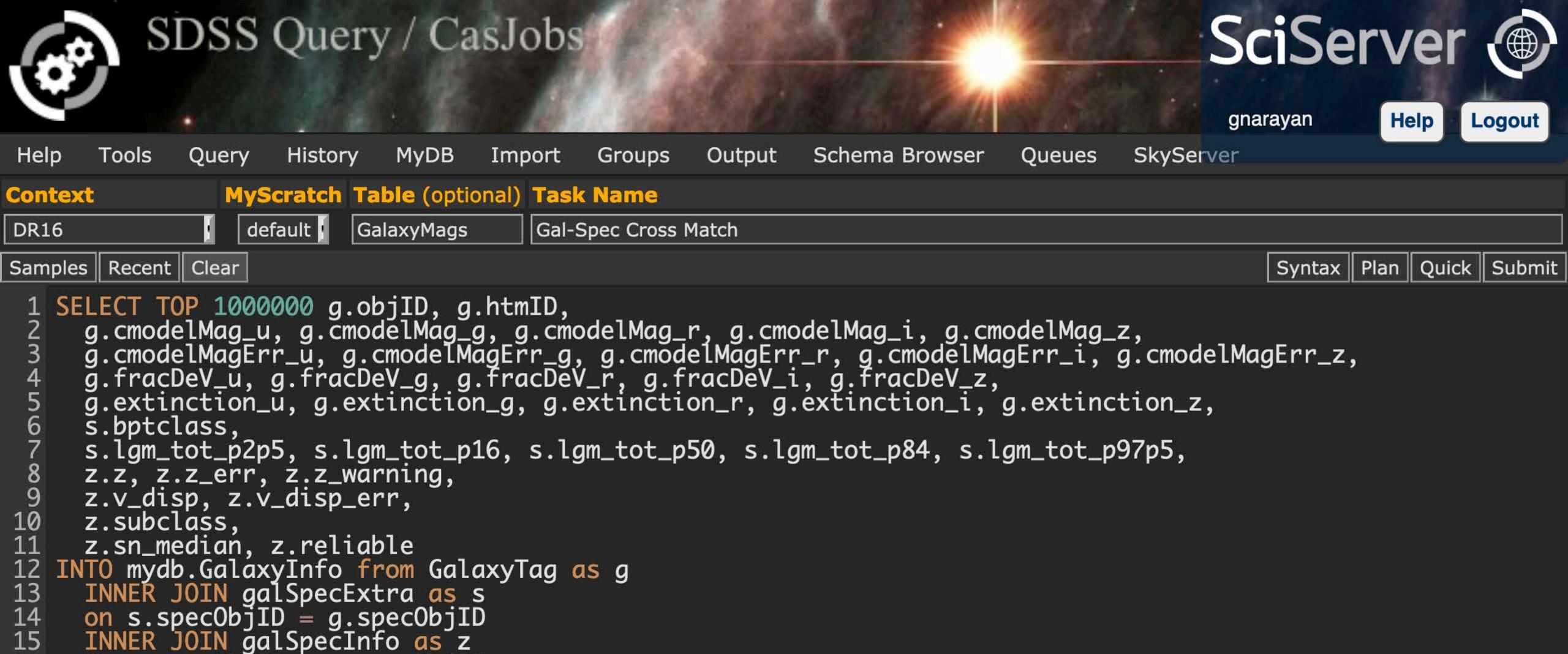
number of rows returned = 206

Table Info

### TRADITIONAL ARCHIVES

Plot marked spectra | Submit marked data for retrieval from STDADS Mark all Unmark all Mark public Unmark public Mark proprietary Unmark proprietary Central Proposal Preview Scar **Stop Time** Ref **Start Time** Filters/Gratings Release Date Dataset **Target Name** Instrument Apertures (J2000)(J2000)ID Typ Wavelength Name WFC3 UVIS2-C1K1C-SUB F814W 8029.322 IDKV31010 NGC4321 12 22 54.831 +15 49 18.54 5 2018-02-04 17:27:37 2018-02-04 17:40:45 500.000 15133 2018-08-05 03:58:00 IDKV31010 5 2018-02-04 17:42:47 2018-02-04 17:59:15 700.000 F475W 15133 2018-08-05 04:00:13 IDKV31020 IDKV31020 NGC4321 12 22 54.831 +15 49 18.54 WFC3 UVIS2-C1K1C-SUB 4772.171 F160W IDKV31030 5 2018-02-04 18:01:35 2018-02-04 18:14:37 596.924 WFC3 IR 15369.176 NGC4321 12 22 54.831 +15 49 18.54 15133 2018-08-05 03:32:06 IDKV31030 J8PP22011 NGC4321 12 22 54.900 +15 49 20.70 8 2004-05-30 19:13:28 2004-05-30 19:32:37 1100.000 ACS HRC CLEAR1S;F814W 8099.662 9776 2005-05-30 23:33:59 J8PP22011 NGC4321 F555W;CLEAR2S J8PP22021 12 22 54.900 +15 49 20.70 8 2004-05-30 20:46:47 2004-05-30 21:05:56 1100.000 ACS HRC 5355.754 9776 2005-05-30 23:35:01 J8PP22021 J8PP22W7Q 8 2004-05-30 19:10:59 2004-05-30 19:12:41 100.000 ACS 8099.662 NGC4321 12 22 54.900 +15 49 20.70 HRC CLEAR1S;F814W 9776 2005-05-30 23:34:20 J8PP22W7Q J8PP22WAQ ACS HRC F555W;CLEAR2S 5355.754 NGC4321 12 22 54.900 +15 49 20.70 8 2004-05-30 19:34:25 2004-05-30 19:36:07 100.000 9776 2005-05-30 23:34:50 J8PP22WAQ O8PP41010 NGC4321 7.000 STIS F28X50LP **MIRVIS** 7210.932 9776 2006-12-17 23:20:39 12 22 54.900 +15 49 20.70 8 2004-04-08 04:42:10 2004-04-08 04:43:01 STIS 52X0.2 G750M 9776 2006-12-18 01:44:00 O8PP41020 O8PP41020 NGC4321 8561.000 12 22 54.900 +15 49 20.70 8 2004-04-08 04:48:18 2004-04-08 05:20:42 1900.000 STIS F28X50LP MIRVIS O8PP41URQ NGC4321 12 22 54.900 +15 49 20.70 8 2004-04-08 04:36:15 2004-04-08 04:40:01 20.100 0.000 9776 2006-12-20 03:54:27 O8PP42010 NGC4321 12 22 54.900 +15 49 20.70 8 2004-03-26 15:51:51 2004-03-26 15:52:45 10.000 STIS F28X50LP MIRVIS 7210.977 9776 2006-12-20 06:15:00 O8PP42020 STIS 52X0.2 G750M NGC4321 12 22 54.900 +15 49 20.70 8 2004-03-26 15:58:01 2004-03-26 16:30:25 1900.000 8561.000 9776 2006-12-20 08:11:48 O8PP42020 STIS MIRVIS O8PP42P6Q NGC4321 12 22 54.900 +15 49 20.70 8 2004-03-26 15:45:56 2004-03-26 15:49:42 20.100 F28X50LP 0.000 9776 2005-03-26 15:49:42 8 2004-03-27 09:21:08 2004-03-27 09:22:02 O8PP43010 NGC4321 STIS F28X50LP MIRVIS 9776 2006-12-01 07:08:07 12 22 54.900 +15 49 20.70 10.000 7210.975 O8PP43020 NGC4321 12 22 54.900 +15 49 20.70 8 2004-03-27 09:27:18 2004-03-27 09:59:42 1900.000 STIS 52X0.2 G750M 8561.000 9776 2004-03-27 12:45:19 O8PP43020 O8PP43U9Q NGC4321 STIS F28X50LP MIRVIS 0.000 12 22 54.900 +15 49 20.70 8 2004-03-27 08:13:58 2004-03-27 08:17:44 20.100 9776 2006-12-21 12:45:00 G750M STIS 52X0.2 8561.000 O8PP410A0 NGC4321 12 22 54.954 +15 49 20.12 9776 2006-12-19 23:11:31 O8PP410A0 8 2004-04-08 10:59:05 2004-04-08 11:43:47 2560.000 ☐ <u>J9B031010</u> NGC4321 CLEAR1S;F330W 10548 2007-01-26 15:56:23 J9B031010 N4321 O4E013020 52X0.2 G750M 28 1999-04-23 04:33:22 1999-04-23 04:48:53 931.000 6581.000 7361 2007-01-05 21:30:13 O4E013020 O4E013010 N4321 52X0.2 G750M 6581.000 STIS 12 22 54.860 +15 49 21.19 28 1999-04-23 04:17:12 1999-04-23 04:32:12 900.000 7361 2007-01-06 03:54:54 O4E013010 G430L O4E013050 N4321 STIS 52X0.2 4300.000 12 22 54.860 +15 49 21.19 28 1999-04-23 07:30:38 1999-04-23 07:44:00 802.000 7361 2000-04-23 07:44:00 O4E013050

Access to raw/de-trended data products after some proprietary period. Limited query, no compute.



### SDSS - CATALOG QUERIES VIA SQL

ON z.specObjID = s.specObjID

17 WHERE g.clean=1;

Community access to SDSS images, spectra, catalogs in data releases + nice interfaces and API. Query but not compute.



# THE KEY CHALLENGE FOR THE NEXT GENERATION OF SURVEYS IS NOT JUST TAKING VAST QUANTITIES OF DATA,

BUT HOW TO ENABLE THE COMMUNITY TO USE IT.

FOR THE TIME-DOMAIN, THIS IMPLIES
REAL-TIME DATA STREAMS FROM HETEROGENOUS SOURCES

# 2. WHAT ALERT BROKERS CAN DO

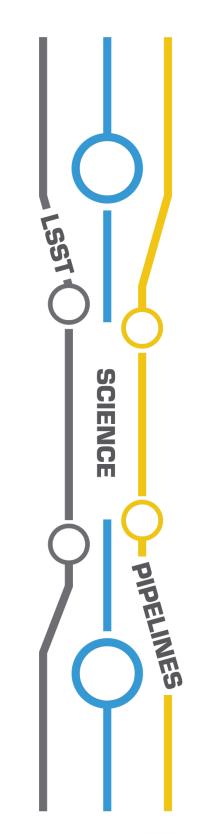
#### WHAT DO WE NEED?

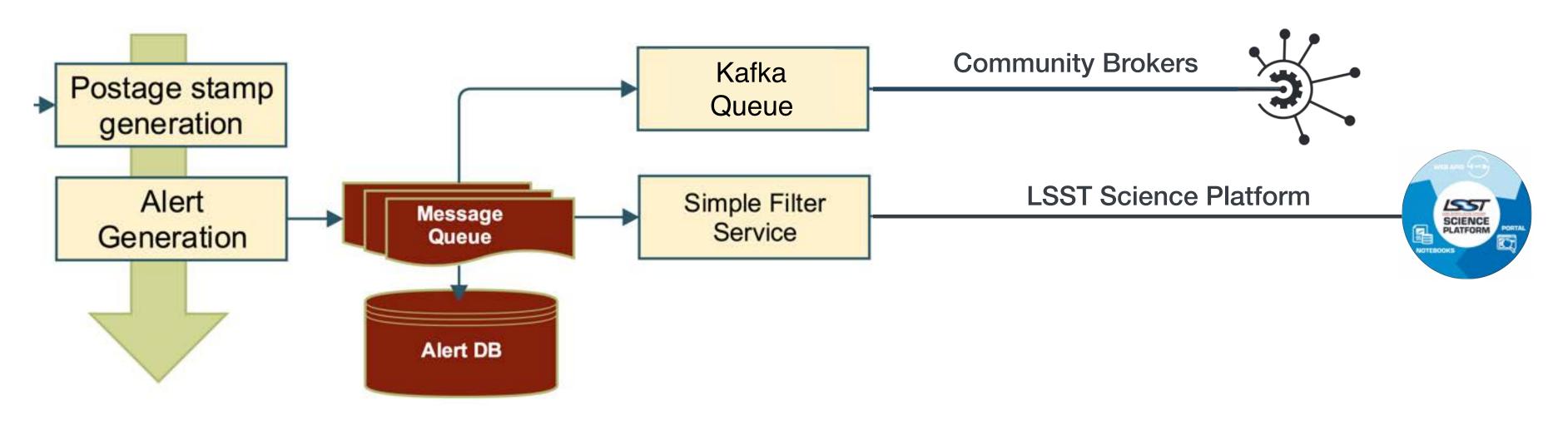
- Something to sift through heterogenous alert streams in real-time
- Characterize and classify events
- Identify outliers
- Prioritizes events for follow-up
- Actively learns from the follow-up
- All while providing a search, filtering and compute service to the community

#### **Alert Distribution and Brokers**



Alerts are delivered to the community brokers that filter and classify events to enable realtime science.





#### **Community Brokers**

- Software developed independently of LSST to receive, characterize and/or redistribute Alerts.
- Added functionality such as, filtering, photometric classification & cross-matching with other surveys
- Limited number selected by a proposal process receive the full realtime stream

#### LSST Alert Filtering Service

Limited capacity service provisioned through the LSP; simple filters on alert packet contents only

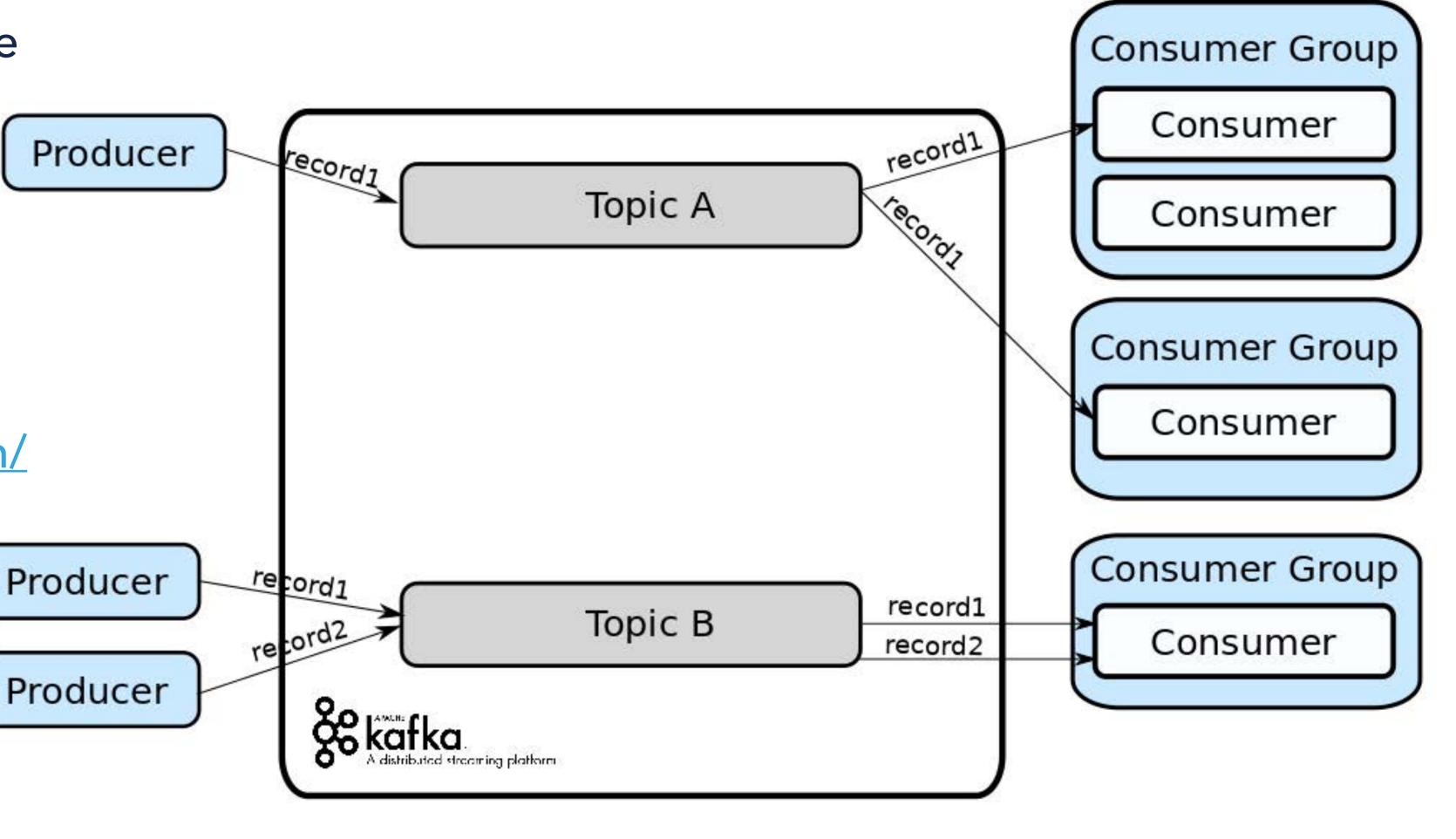
**Plans and Policies for LSST Alert Distribution** 



#### **ALERTS**

- Alerts for ZTF now and soon for LSST use an Apache Kafka queue
- Alerts are formatted using
  Apache Avro (effectively
  serialized JSON, with a schema)
- https://github.com/lsst/
  alert\_packet/tree/master/python/
  lsst/alert/packet/schema/4/0
- Very much a successor toVOEvent
  - SCiMMA group is adding an IAM layer to Kafka with HopSkotch: <a href="https://">https://</a>

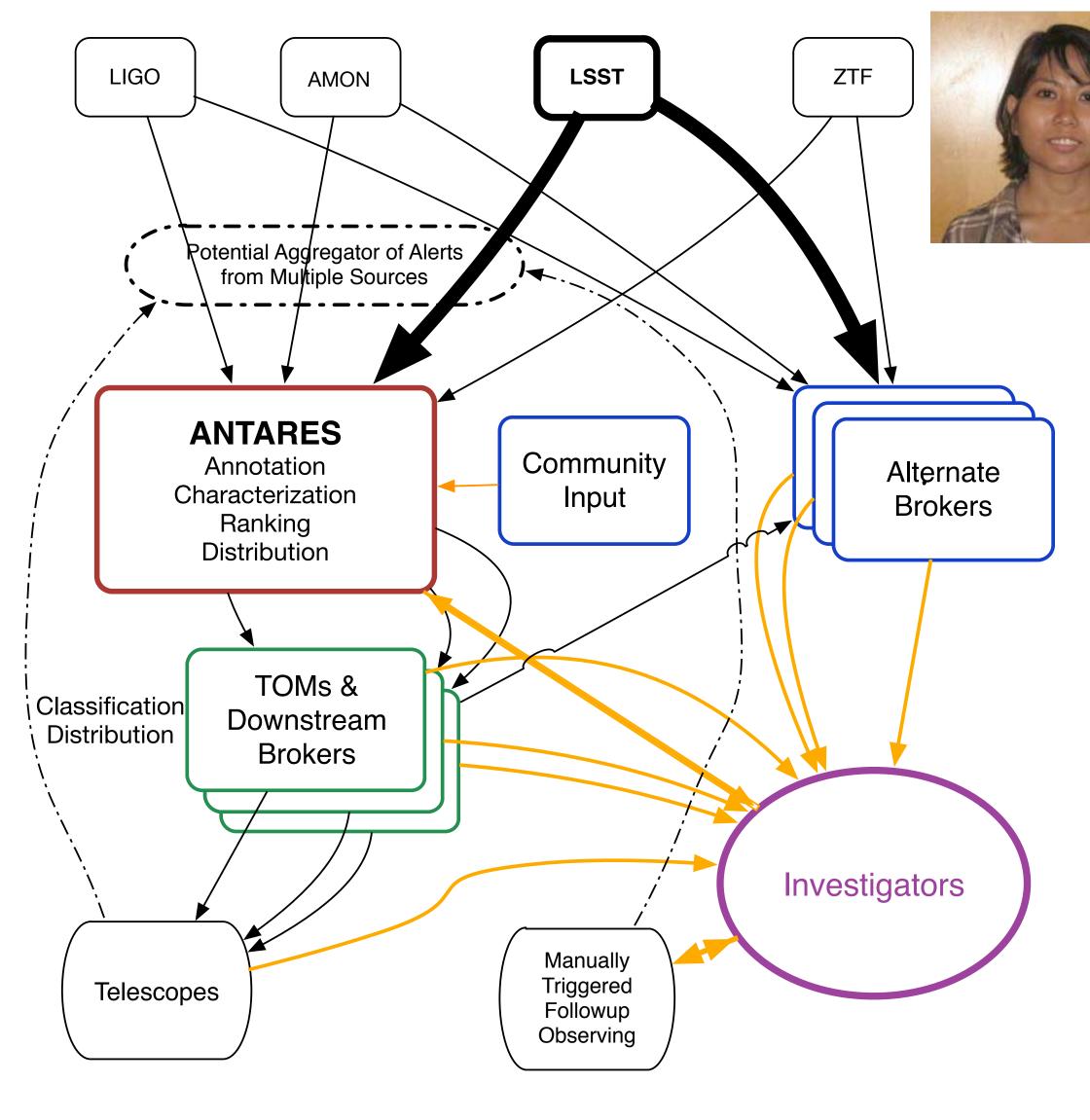
scimma.org/projects.html



HOW CTA CAN ENGAGE 1: START TO WORK WITH SCIMMA/LSST/ZTF/LVK/SNEWS ON ALERTS

#### THE BROKER ECOSYSTEM

Monika Soraisam, Nic Wolf, Adam Scott, Carl Stubens, Chien-Hsiu Lee (Project Scientist), and Tom Matheson (PI)



System Data Flow

Feedback

Info to/from Investigators







 ANTARES manages alert streams, adding contextual information, characterizing events, ranking & distributing

 Write your filters for complex, targeted processing, or broad analysis of large datasets - do YOUR science!

Correlate optical, GW & high-energy particle/neutrino triggers - multi-messenger astrophysics

Active with ZTF! Sign up!
 <a href="https://antares.noirlab.edu/">https://antares.noirlab.edu/</a>



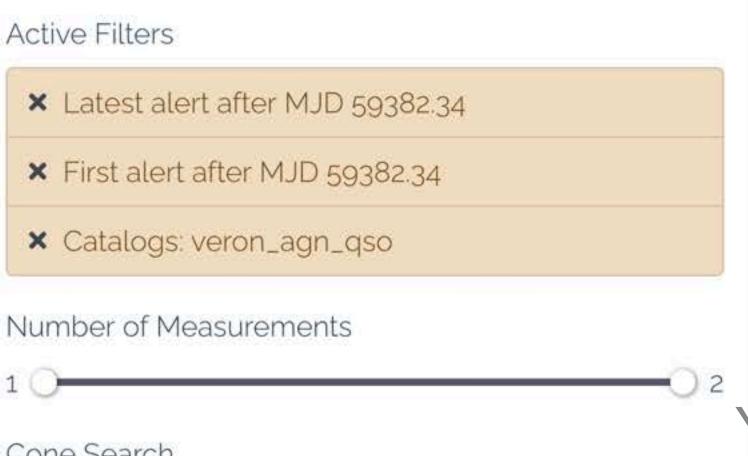
# 

The next few slides cover the same material in the live demo in static form for those looking at the slides In each case, I've highlighted some of ANTARES' capabilities followed by some science cases that can use them

Radius: 1

Explore Favorites Filters Tags Watch Lists Catalogs Pipeline Properties

FAQ Support gnarayan 🕶



1 🔾		2
Cone S	Search	
Center.	Enter a coordinate string	

С	atalogs
	veron_agn_qso (4)
	2mass_xsc (3)
	amass nsc (a)

2mass_psc (2)
allwise (2)
bright_guide_star_cat (2)
ned (2)
RC3 (1)
gaia_dr2 (1)
nyu_valueadded_gals (1)
sdss_gals (1)

>_						Showing 1-4 of 4	25 🗢 🔍 🔻 1 >
ID	ZTF ID \$	RA \$	Dec \$	Latest Mag \$\Bi	rightest Mag  # Al	erts\$ Latest Alert	First Alert
ANT2021q6f76	ZTF21abhotwz	28.68	27.33	18.39	18.39	2 2021-06-19 11:15:5	6 2021-06-19 11:12:58
NT2021qq4ls	ZTF18abkxozh	262.30	70.55	18.69	18.69	1 2021-06-18 05:14:	08 2021-06-18 05:14:0
ANT2021qqh76	ZTF18aaqdill	195.50	27.78	19.07	19.07	1 2021-06-18 04:42:	25 2021-06-18 04:42:2
ANT2021qp26k	ZTF19abahorj	48.76	42.04	18.74	18.74	1 2021-06-17 11:15:0	0 2021-06-17 11:15:00

You can think of ANTARES as a search engine for astrophysical variabilityYou can conesearch, cross-match against existing catalogs

<a href="https://antares.noirlab.edu/catalogs">https://antares.noirlab.edu/catalogs</a>

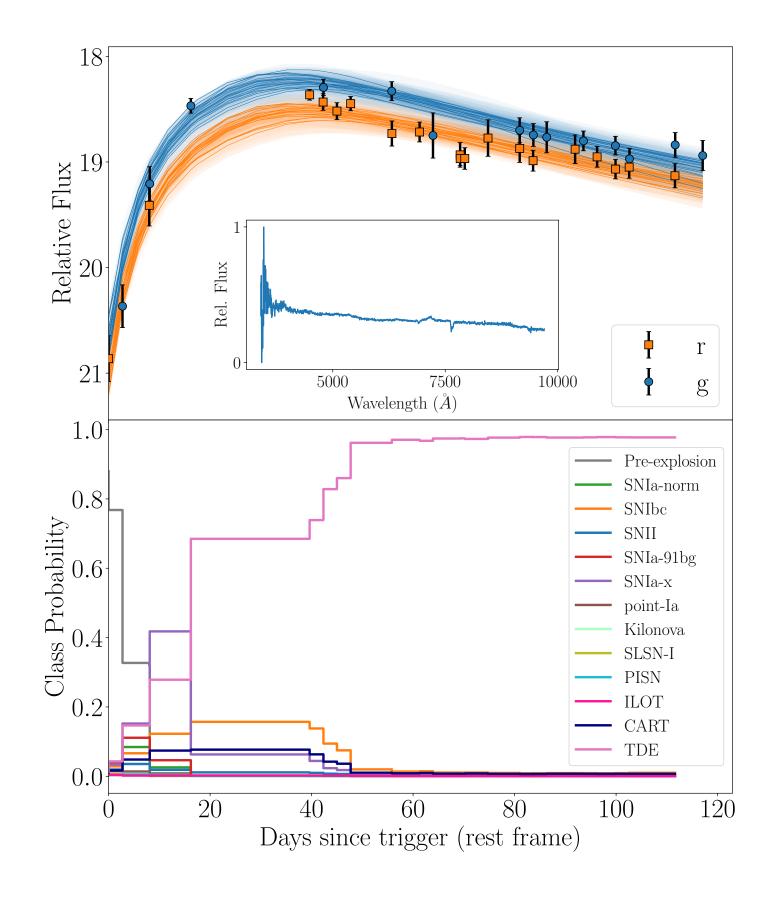
Even require objects that have "tags" attached to them <a href="https://antares.noirlab.edu/tags">https://antares.noirlab.edu/tags</a>

Or create a private watch list to monitor activity for your own sources <a href="https://antares.noirlab.edu/watch-lists">https://antares.noirlab.edu/watch-lists</a>



#### Nuclear Activity: AGN and TDEs

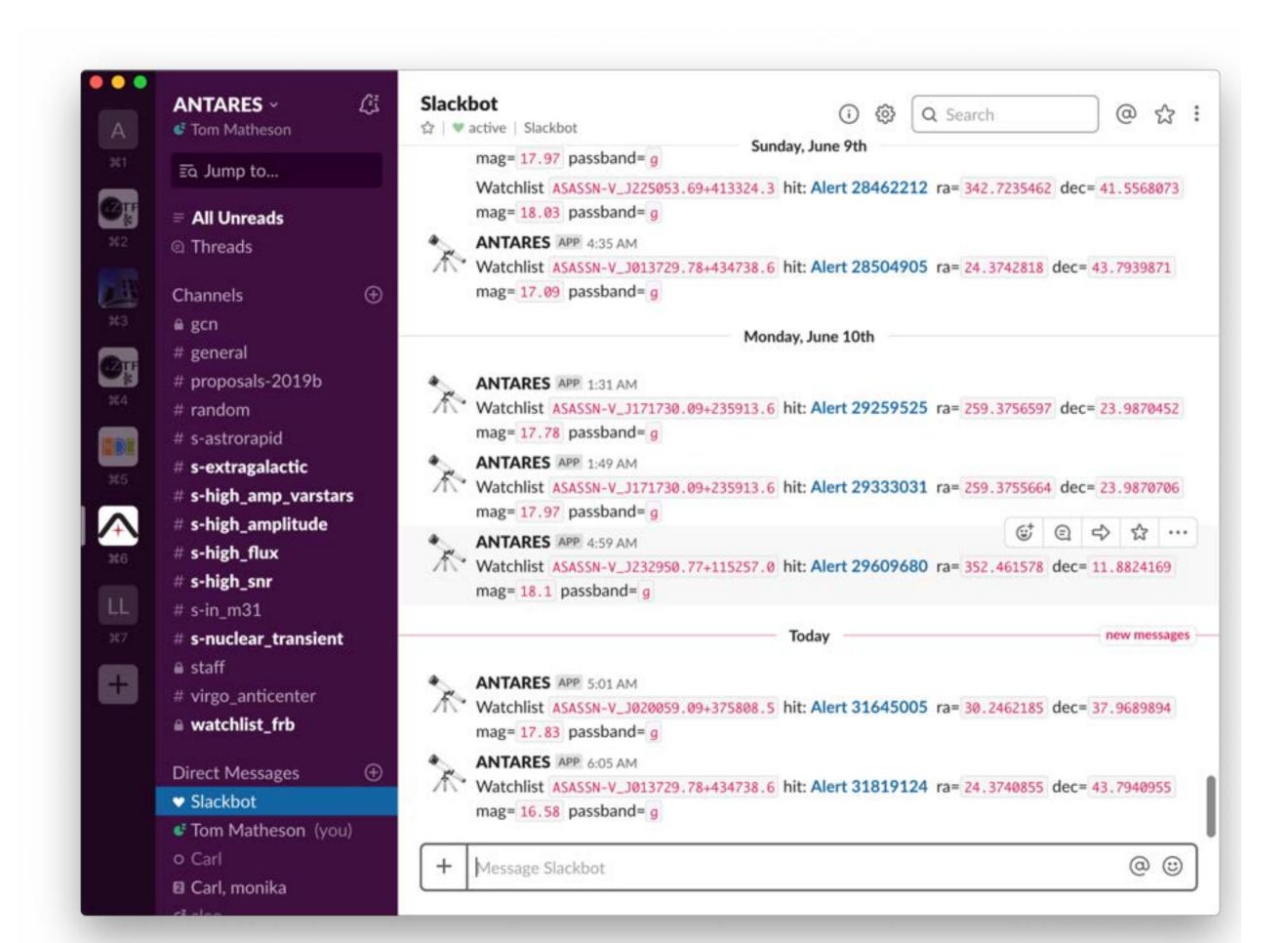
- Identify by location (currently using Van Velzen criteria)
- Multiwavelength catalogs can help distinguish AGN from TDE
- Multiwavelength variability would be useful





#### Watchlists

- Users upload csv file
- Direct notification
   when your object of
   interest alerts
- Slack configuration controls intrusiveness of notifications
- Watch all known strong lensing systems for transients, e.g.



#### Level 2 Filters = TERS

After alerts are ingested, aggregated, and associated with catalogs, ANTARES runs the L2 filters. The purpose of the L2 filters is to detect the interesting science alerts based on custom criteria.

➤ Nuclear Transient

Finding alerts in the nuclear region of a source in the ZTF reference.

```
1 import antares.devkit as dk
3 class nuclear_transient(dk.Filter):
      NAME = "Nuclear Transient"
                                           # Put your Slack user ID here
      ERROR_SLACK_CHANNEL = "UERMCJQ1W"
      REQUIRED_LOCUS_PROPERTIES = [
 6
           'ztf_object_id',
      REQUIRED_ALERT_PROPERTIES = [
10
           'ztf_sgscore1',
           'ztf_distpanr1',
           'ztf_magpsf',
           'ztf_magnr',
           'ztf_distnr',
14
      OUTPUT_LOCUS_PROPERTIES = []
16
      OUTPUT_ALERT_PROPERTIES = []
      OUTPUT_TAGS = [
18
19
               'name': 'nuclear transient'.
```

Tags are set by "filters" <a href="https://antares.noirlab.edu/tags">https://antares.noirlab.edu/tags</a>

ANTARES already has several filters, both created by our staff, and by community users (you!)

YES! We run YOUR code as part of OUR pipeline!

You can develop your own filters using the DevKit Jupyter notebook on AstroDataLab:

https://datalab.noirlab.edu/

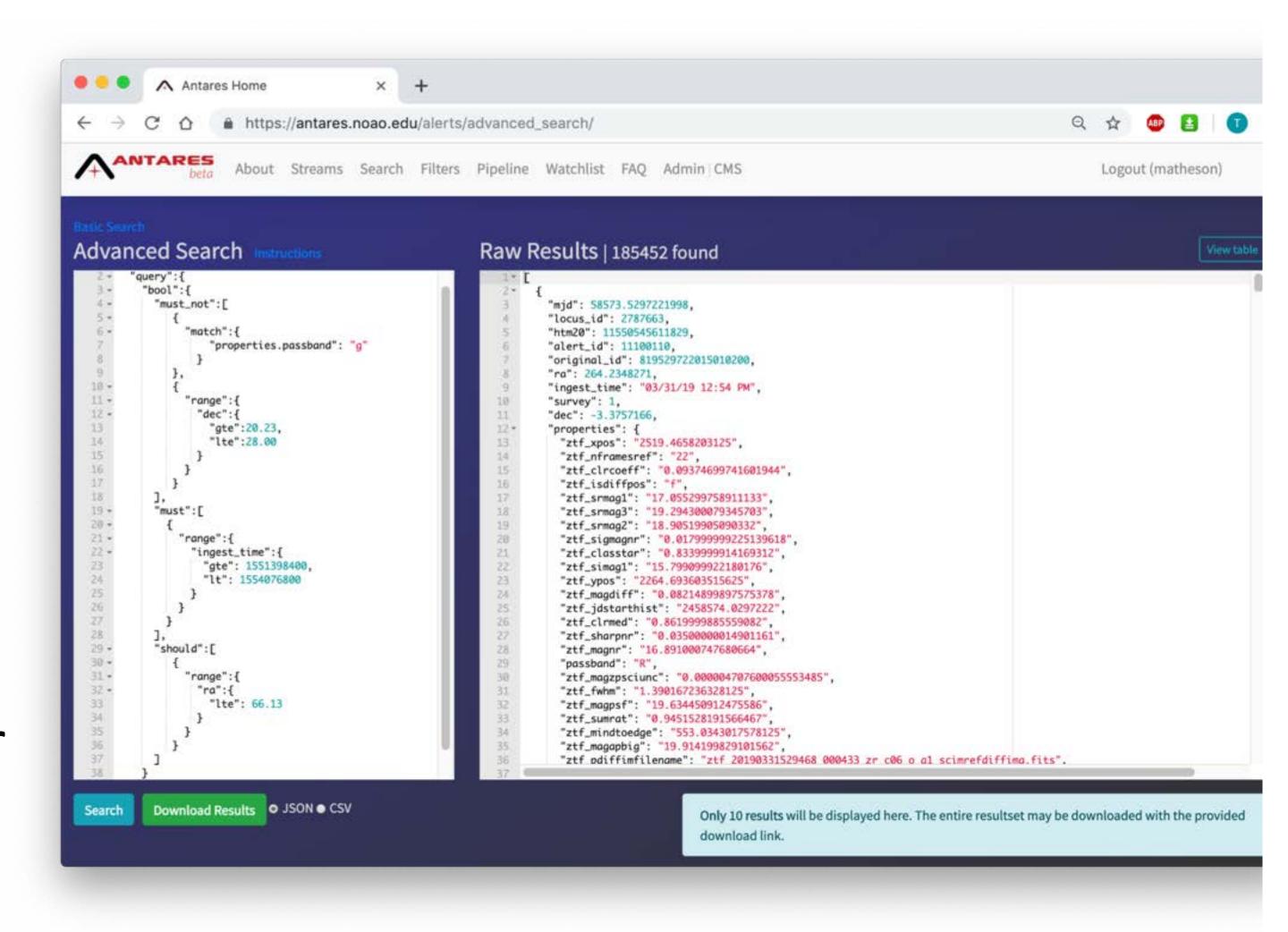
and there's even documentation:
<a href="https://noao.gitlab.io/antares/filter-documentation/devkit/">https://noao.gitlab.io/antares/filter-documentation/devkit/</a>
<a href="mailto:index.html#devkit">index.html#devkit</a>



#### Longer-timescale Transients/Variables

- Many classes don't require immediate response
- Searchable

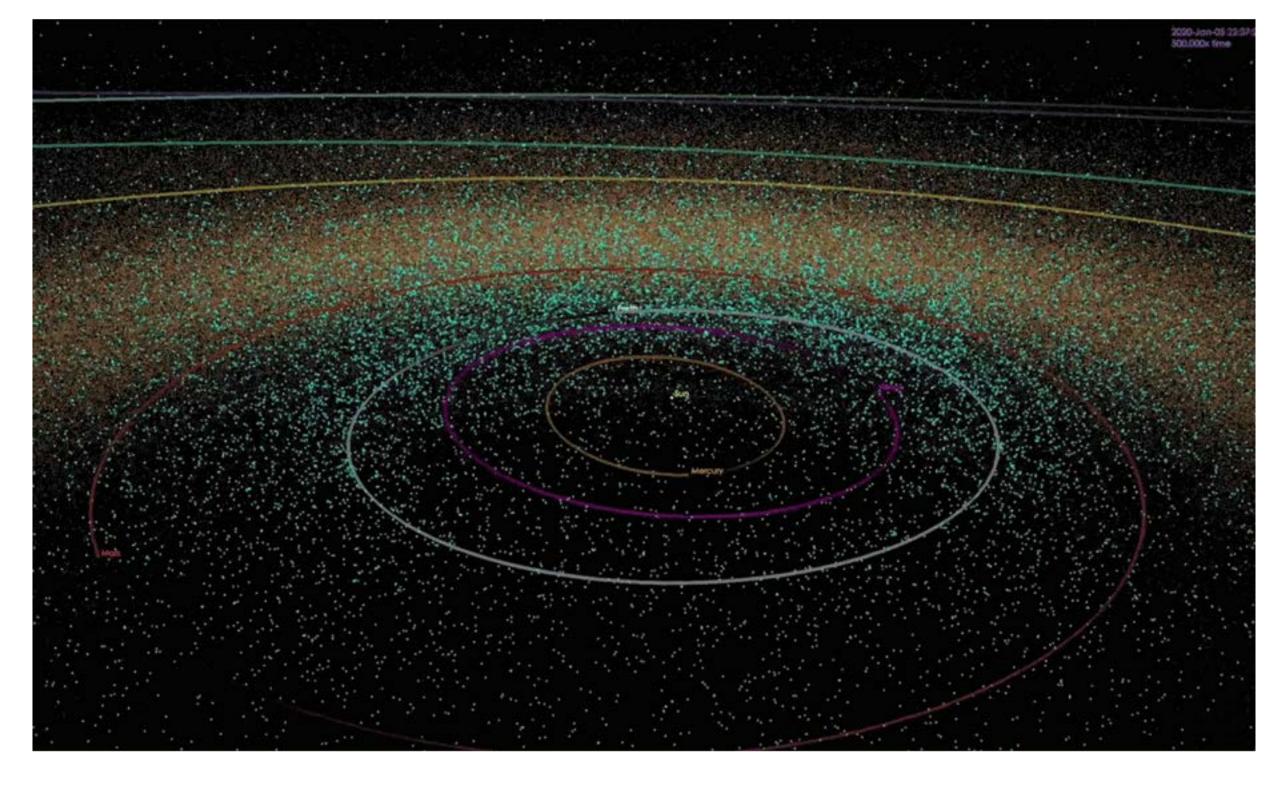
   annotated archive
   provides resource to
   discover these
- Useful for developing filters for shorter-timescale objects





#### Known Solar System Objects

- New Solar System
   objects are on project task
- Known Solar System
   objects flagged in the
   alert stream can be
   redirected to a
   moving-object broker
- Already doing this with ZTF stream and SNAPS team
- Filter on streaked sources

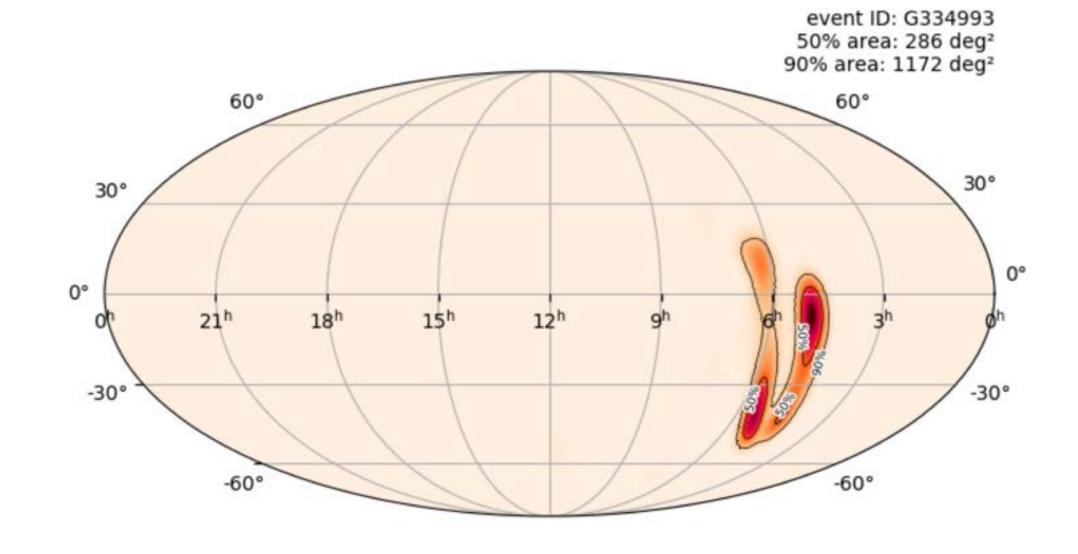


NASA/JPL-Caltech



#### **Enabling Multi-Messenger Astronomy**

- Automatic retrieval of LIGO/Virgo skymaps
- Associate all subsequent alerts within recent skymaps
- Filter using distance and other features



LIGO/Virgo Gracedb

#### PYTHON CLIENTS TO INTERFACE WITH YOUR OWN

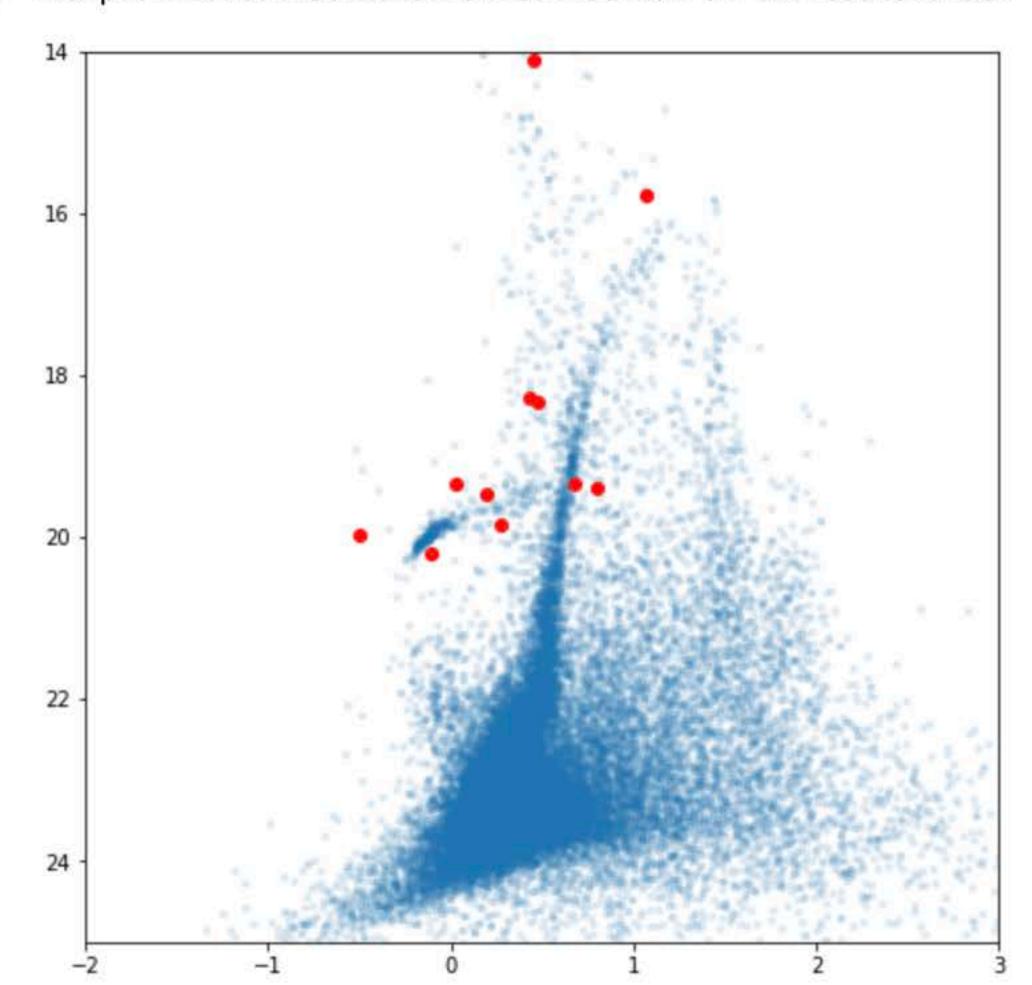
```
In [4]: import antares_client
                                                               Anything you can do on the
        from astropy.coordinates import Angle, SkyCoord
        center = SkyCoord("227.285d 67.222d")
                                                               website, you can do through out
        radius = Angle("0.25d")
                                                                python client - enables much
        locusid=[]
        locus_gr=[]
                                                                richer pipeline development
        locus_r=[]
        print("#Locus, RA, Dec, Num alerts")
        for locus in antares_client.search.cone_search(center, radius):
            if locus.properties['num_mag_values'] > 30:
                print("https://antares.noirlab.edu/loci/lookup/%s" % (locus.properties['ztf_object_id']), locus.ra, locus.dec, locu
        s.properties['num_mag_values'], locus.alerts[-1].properties['ztf_sgmag1'] - locus.alerts[-1].properties['ztf_srmag1'], locu
        s.alerts[-1].properties['ztf_srmag1'])
                locusid.append(locus.properties['ztf_object_id'])
                locus_gr.append(locus.alerts[-1].properties['ztf_sgmag1'] - locus.alerts[-1].properties['ztf_srmag1'])
                locus_r.append(locus.alerts[-1].properties['ztf_srmag1'])
        #Locus, RA, Dec, Num_alerts
        https://antares.noirlab.edu/loci/lookup/ZTF18aapnpxp 227.4650415090125 67.23184959776788 45 -0.10289955139160156 20.20050048
        828125
        https://antares.noirlab.edu/loci/lookup/ZTF18aavahko 227.26304767490103 67.1691137945075 37 0.028499603271484375 19.33889961
        2426758
        https://antares.noirlab.edu/loci/lookup/ZTF18aaqmbqs 227.3569277820102 67.203745733418 74 0.2775993347167969 19.853000640869
        14
        https://antares.noirlab.edu/loci/lookup/ZTF18aaqowgh 227.3502061211087 67.10099379691194 98 0.6824989318847656 19.3421001434
        32617
        https://antares.noirlab.edu/loci/lookup/ZTF18aapscwd 227.6100967449605 67.124552552642 41 0.796600341796875 19.3950996398925
        https://antares.noirlab.edu/loci/lookup/ZTF18aaqmvlf 226.96067721846745 67.15751626751334 44 -0.5004005432128906 19.96330070
        4956055
        https://antares.noirlab.edu/loci/lookup/ZTF18aaoexnp 227.3073308554661 67.25926222542068 376 1.073699951171875 15.7742996215
        82031
        https://antares.noirlab.edu/loci/lookup/ZTF18aapmlzb 227.58436607491905 66.99700820060137 181 0.47480010986328125 18.3330993
        65234375
        https://antares.noirlab.edu/loci/lookup/ZTF18aapklkb 227.1058624585155 67.1582211012635 88 0.19550132751464844 19.4722995758
        05664
        https://antares.noirlab.edu/loci/lookup/ZTF18aaotfbe 227.64738291707317 67.0454438 41 0.4519996643066406 14.103400230407715
        https://antares.noirlab.edu/loci/lookup/ZTF20aabgwer 227.70058449230774 67.21825292417583 91 0.43070030212402344 18.27829933
        166504
```

# In [6]: import requests import json from dl import queryClient as qc df0 = qc.query(sql=sql,fmt='pandas')

#### REAL-TIME COMPUTE ON DATA STREAMS

```
In [7]: plt.figure(figsize=(8,8))
    plt.xlim(-2,3)
    plt.ylim(25,14)
    plt.scatter(df0['g_r'],df0['mag_r'],marker='.',alpha=0.1)
    #plt.scatter(dfhb0['g_r'],dfhb0['mag_r'],marker='.')
    plt.scatter(locus_gr, locus_r,c='r')
```

#### Out[7]: <matplotlib.collections.PathCollection at 0x7f63a49794a8>



As an example, instead of looking at sources singly, you can write an SQL query as you might with SDSS CASJobs

Submit it to ANTARES, and get all matching objects from the real-time alert stream (NO WAITING FOR A DATA RELEASE!)

You can make plots like a CMD interactively to select outlying sources

This notebook is available here:

https://github.com/broker-workshop/tutorials/

blob/main/ANTARES/

Exploring Variability With ANTARES.ipynb

#### REAL-TIME FOLLOWUP WITH TOMS

```
In [69]: from antares_client.search import get_by_id, get_by_ztf_object_id
    #get locus by ANTARES ID
    locus = get_by_id("ANT2018c7igm")

#get locus by ZTF ID
    #locus = get_by_ztf_id("ZTF18abhjrcf")

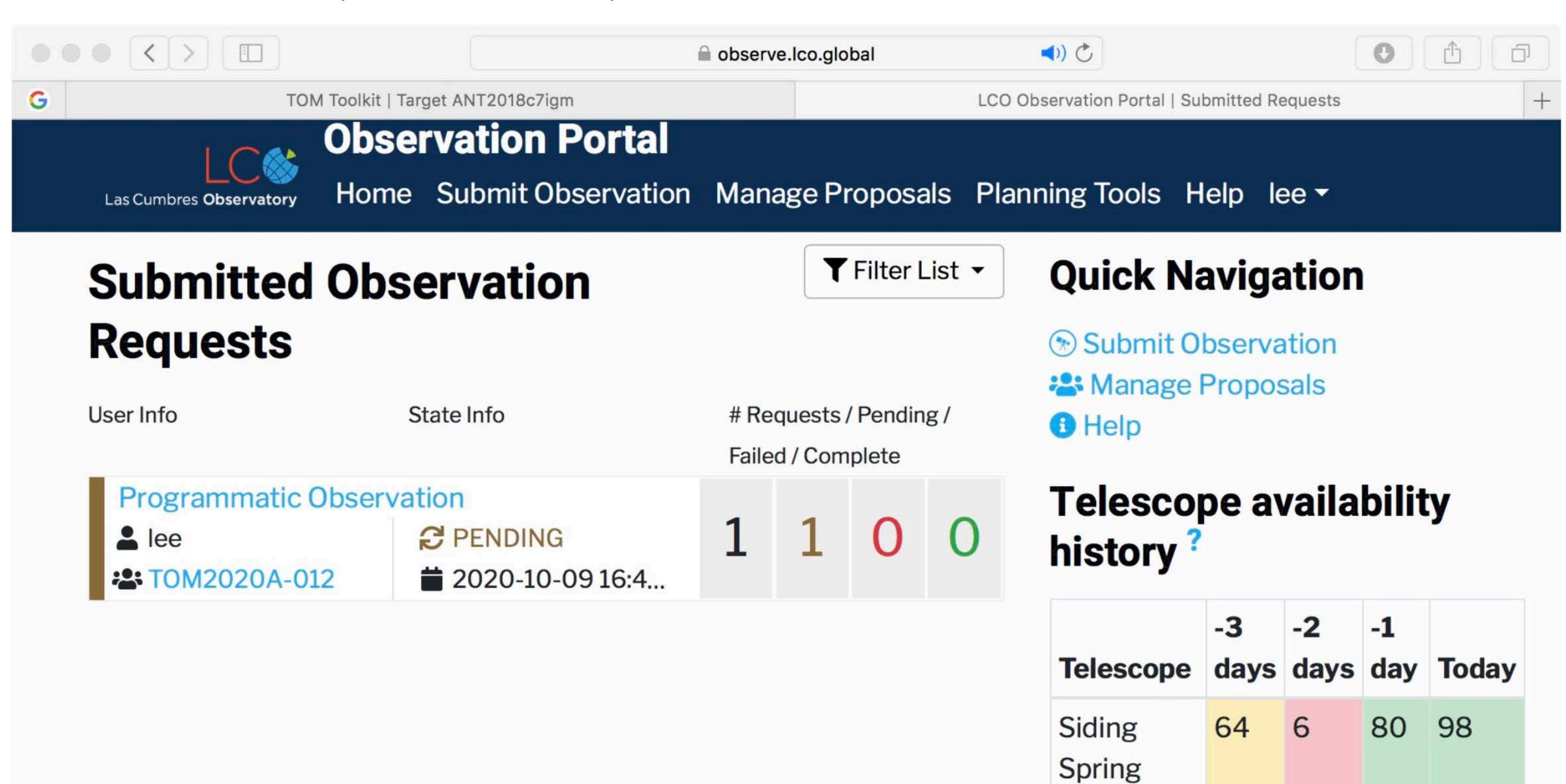
print(locus.locus_id, locus.ra, locus.dec)

import os
    os.environ["DJANGO_ALLOW_ASYNC_UNSAFE"] = "true"
    from tom_targets.models import Target
    t = Target.objects.create(name=locus.locus_id, type='SIDEREAL', ra=locus.ra, dec=locus.dec)
```

ANT2018c7igm 280.6927190683333 -12.904117143333334

```
In [64]: from tom_observations.facilities.lco import LCOFacility, LCOBaseObservationForm
        target = Target.objects.get(name=locus.locus_id)
                                                              Convince a TAC to give you time
        form = LCOBaseObservationForm({
            'name': 'Programmatic Observation',
                                                              Find object of interest in the stream
            'proposal': 'TOM2020A-012',
            'ipp_value': 1.05,
            'start': '2020-10-09T00:00:00',
                                                              Create a followup observation request and submit
            'end': '2020-10-10T00:00:00',
            'filter': 'R',
            'instrument_type': '1M0-SCICAM-SINISTRO',
            'exposure_count': 1,
                                                              This notebook is available here:
            'exposure_time': 20,
            'max_airmass': 4.0,
                                                              https://github.com/broker-workshop/tutorials/
            'observation_mode': 'RAPID_RESPONSE',
            'target_id': target.id,
                                                              blob/main/ANTARES/ANTARES-TOM-AEON.ipynb
            'facility': 'LCO'
        })
```

We can also see the observation request at the LCO observation portal:



0.4mB

Siding

Carina 2m

59

6

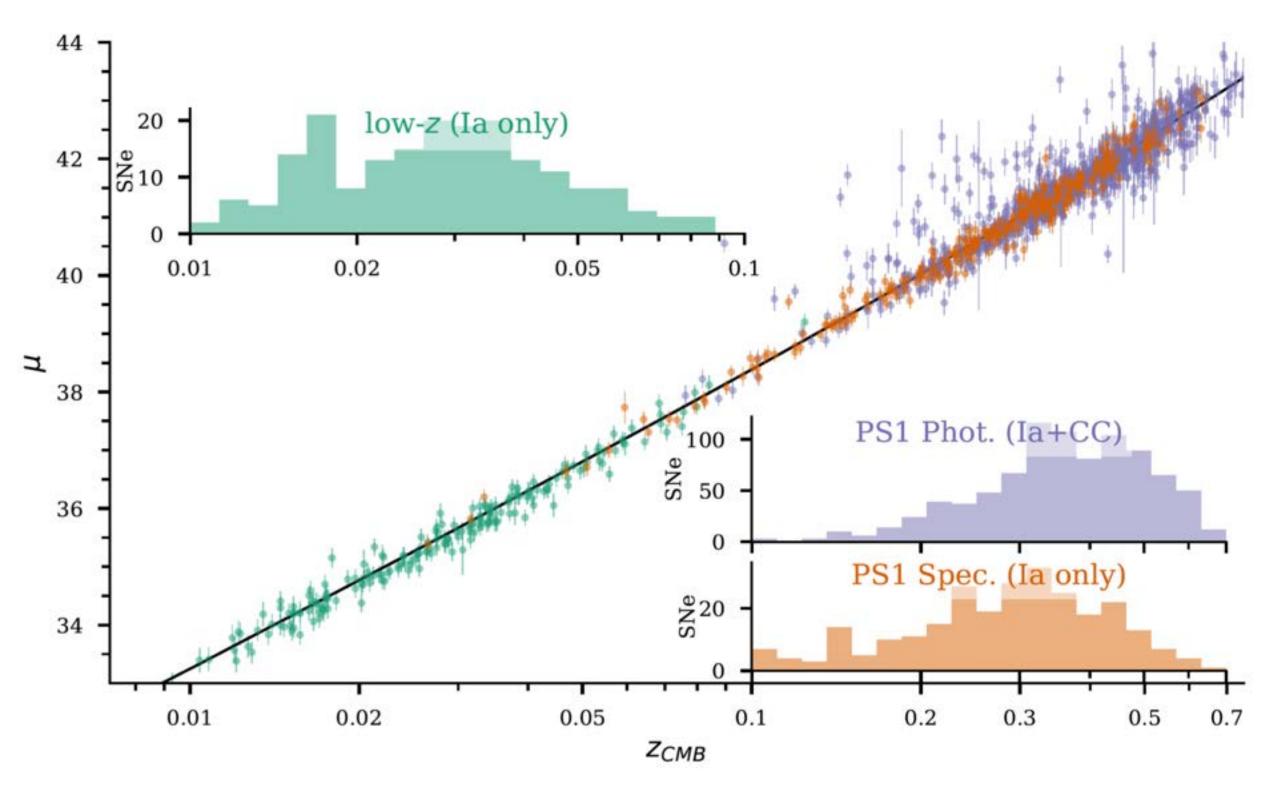
95

98



#### **Transients on Demand**

- Common transients don't all need follow up
- Targeted/scheduled programs can get transients as needed
- Filters can be flexibly scheduled to accommodate a variety of needs



Pan-STARRS Type la Supernovae, Jones et al. 2018

### **SN 2021pkt**

### **RA/DEC (2000)**

Redshift

16:42:21.584 +57:04:06.18

SN la 0.167

250.58993258752503 +57.0683840375256

Classification Report Discovery Report

ZTF

**ANTARES** 

Filter

r-ZTF

Discovering Data Source Discovery Date

2021-06-10 09:14:15.360

Discovery Mag



SIMBAD SkyMapper

**DECaLS** VizieR ADS

WISE

PanSTARRS-1

DSS







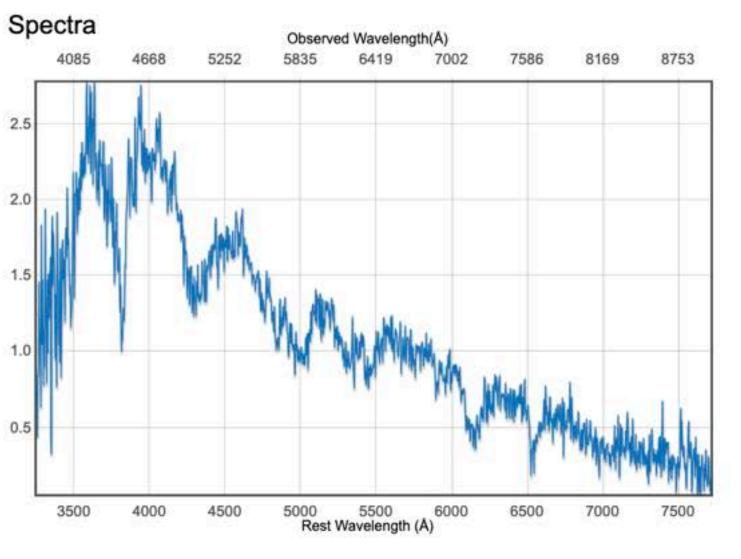
Zoom Full

Auto Zoom

Binning factor: 1

Patrick Aleo (UIUC), Chien-Hsiu Lee (NSF's NOIRLab), Konstantin Malanchev (UIUC), Thomas Matheson (NSF's NOIRLab), Gautham Narayan (UIUC), Abhijit Saha (NSF's NOIRLab), Carlos Scheidegger (U. Arizona), Adam Scott (NSF's NOIRLab), Monika Soraisam (UIUC), Carl Stubens (NSF's NOIRLab), Nicholas Wolf (NSF's NOIRLab)

Patrick Aleo, Chien-Hsiu Lee, Konstantin Malanchev



Mouse hovers at WL: 7276.01 (rest),8491.10 (observed)

(rounded to nearest integer >1)

SN_2021pkt - 2021-06-16 00:00				and the second second.		CHARLES AND ADDRESS OF THE PARTY OF THE PART	1000	).167
Select all		spectra	Clear spectra selection		Download selected ASCII		Reload	
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☐ Show C III at		z=0.167	v <sub>exp</sub> =0	km/s	☐ Show Na at	z=0.167	v <sub>exp</sub> =0	km/s
Show C IV at		z=0.167	v <sub>exp</sub> =0	km/s	☐ Show Mg at	z=0.167	v <sub>exp</sub> =0	km/s
Show N II at		z=0.167	v <sub>exp</sub> =0	km/s	Show Mg II at	z=0.167	v <sub>exp</sub> =0	km/
Show N III at		z=0.167	v <sub>exp</sub> =0	km/s	Show Si II at	z=0.167	v <sub>exp</sub> =0	km/
Show N IV at		z=0.167	v <sub>exp</sub> =0	km/s	☐ Show S II at	z=0.167	v <sub>exp</sub> =0	km/
☐ Show N V at		z=0.167	v <sub>exp</sub> =0	km/s	☐ Show Ca II at	z=0.167	v <sub>exp</sub> =0	km/s
☐ Show O at		z=0.167	v <sub>exp</sub> =0	km/s	Show [Ca II] at	z=0.167	v <sub>exp</sub> =0	km/s
Show [O I] at		z=0.167	v <sub>exp</sub> =0	km/s	☐ Show Fe II at	z=0.167	v <sub>exp</sub> =0	km/s
Show O II at		z=0.167	v <sub>exp</sub> =0	km/s	☐ Show Fe III at	z=0.167	v <sub>exp</sub> =0	km/
Show	A at	z=0.167	v <sub>exp</sub> =0	km/s	☐ Show Tellurics			
Show	A at	z=0.167	v <sub>exp</sub> =0	km/s	☐ Show Galaxy lines at	z=0.167		
Show	A at	z=0.167	v <sub>exp</sub> =0	km/s	Show WR-WN at	z=0.167	v <sub>exp</sub> =0	km/s
Show	A at	z=0.167	v <sub>exp</sub> =0	km/s	Show WR-WC/O at	z=0.167	v <sub>exp</sub> =0	km/

The Python Client + TOMs integration means you can roll a full real-time followup pipeline easily

- Find an interesting source in CTA data
- Send it out in your alert stream
- Use the client to see if it is associated with anything in optical or gets tagged if it passes your filter criterion
- Report to TNS automatically
- Use TOM Toolkit to schedule followup https://www.wis-tns.org/ object/2021pkt

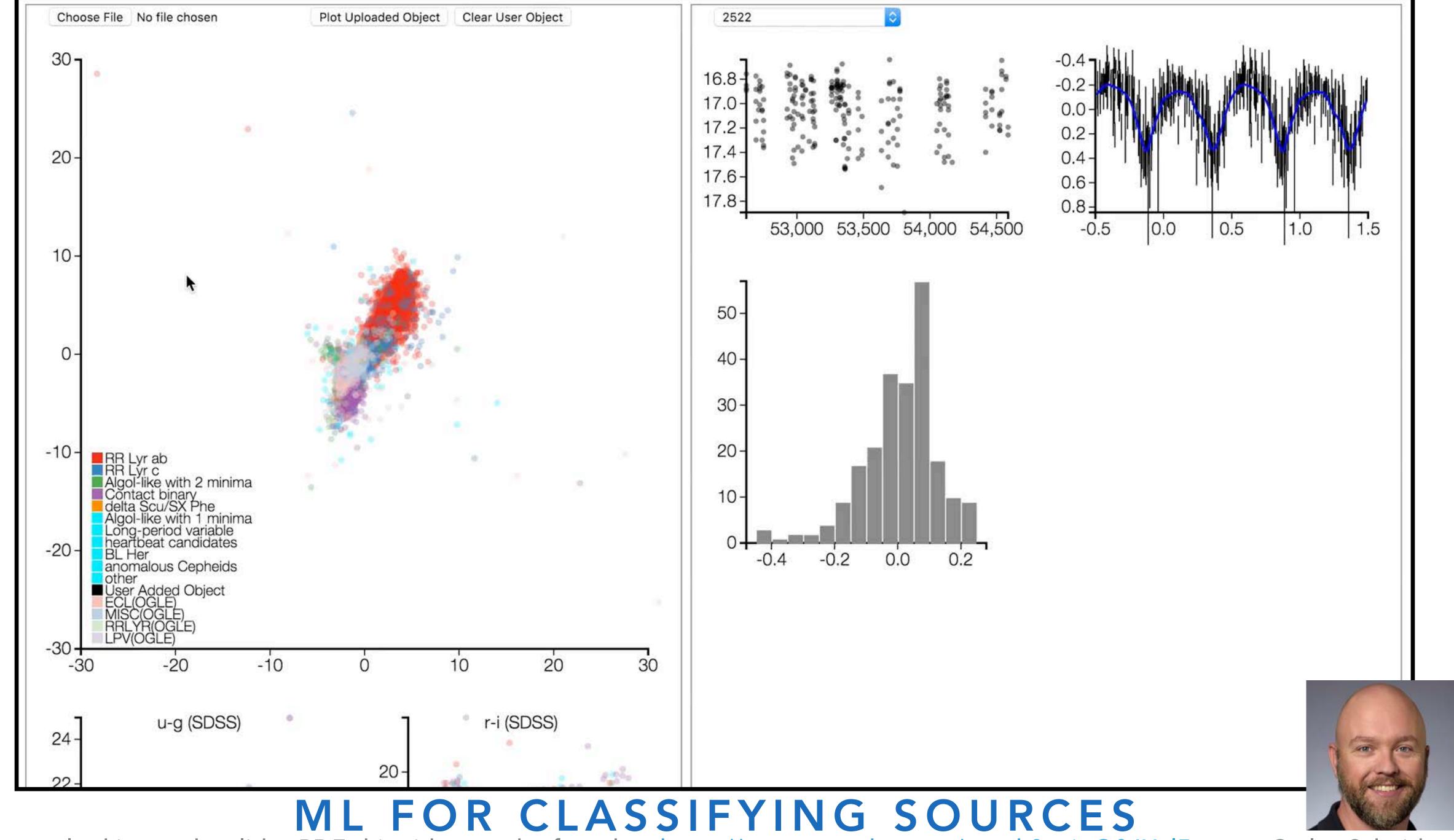
# HOW CTA CAN ENGAGE 2-4:

IF YOU HAVE A CATALOG OF SOURCES ALREADY, YOU CAN START MONITORING THEM IN OTHER BANDS ALREADY

PATHFINDER FACILITIES ARE GREAT SOURCES OF ALERTS FOR TESTING! REACH OUT TO ANTARES IF YOU WANT TO PUBLISH THEM!

SCIENCE USE CASES IMPLICITLY DEFINE FILTERS – WE CAN HELP DEVELOP THEM!

# 3. USING BROKERS TO OPTIMIZE SURVEYS



Carlos Scheidegger

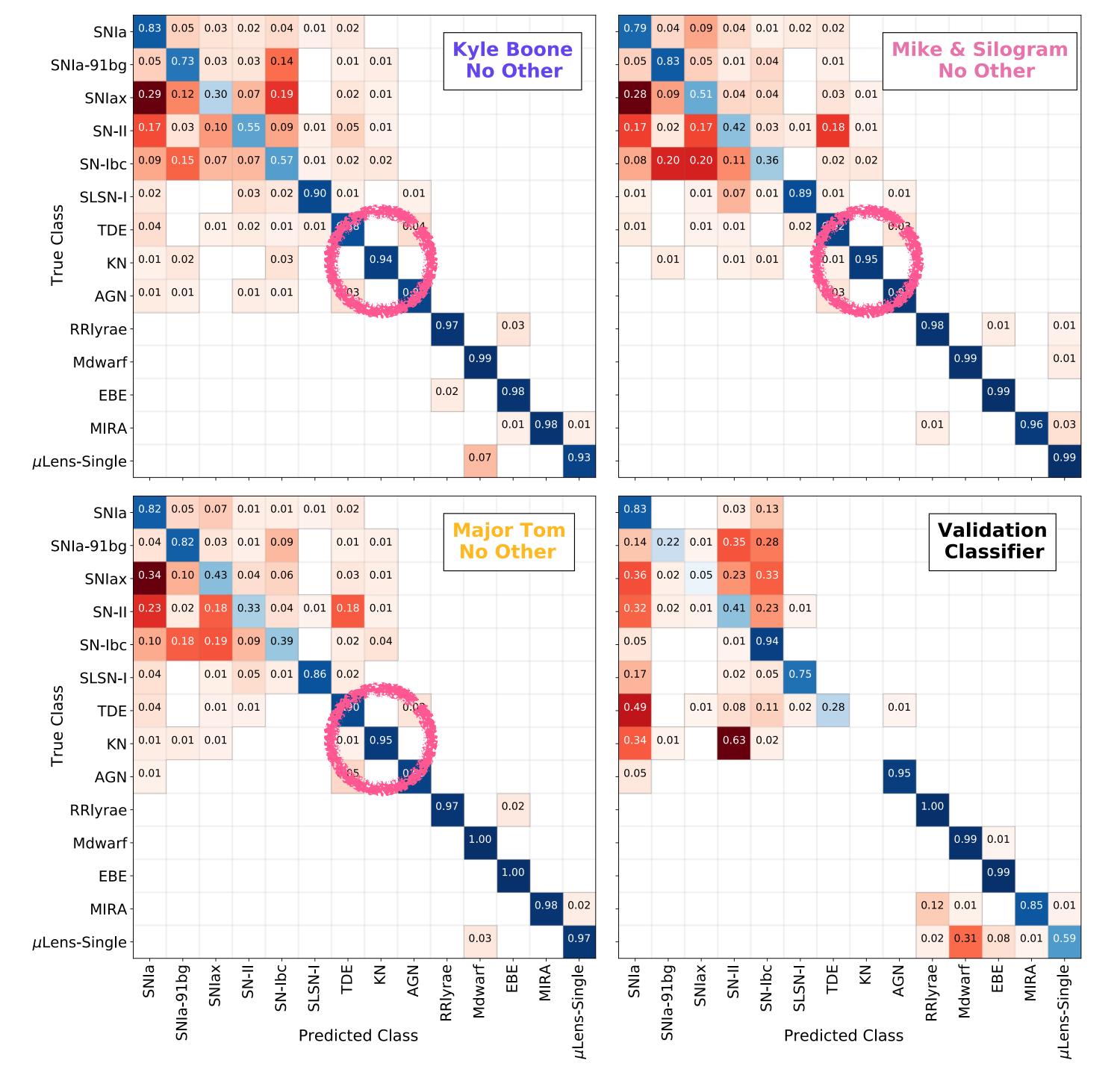
# PLAsTiCC Version 1 (Dec. 2018 - Feb 2019)

- Public \$25k Kaggle challenge for photometric classification of time-domain sky (15 models, 1 million new SEDs, unrepresentative training sample)
- Data: 3M VRO-simulated ugrizY lightcurves
- Primary goal: setup massive time-domain simulation infrastructure, jump start

(Villar+2021)

ML photometric classification efforts

Gaussian process PLAsTiCC Training Sample PLAsTiCC Test Sample interpolation of light curves (LCs) RR Lyrae SNIax (35,782) μ-lens (239)(63,664)<sub>SNIa-91bg</sub> SNII Encode LCs with VRAENN SNII (1,193)(1,000,150)AGN SNIa-91bg SNIax (370)(183)M Dwarf (96,572) (93,494) SNIbc TDE (495)(484)AGN (101,424)Layer SNIbc SNIa (175,094)(2,313)(1,659,831)M Dwarf (981)(924)Assign each LC an anomaly RR Lyrae score via isolation forest (197,455) (Hložek+2020)



- If you believe the outcome of PLAsTiCC, then MMA source discovery will not be a problem!
- <Narrator>: But it will be a problem!
- LSST Cadence has a median intranight gap of ~4 days across all filters, and ~10 days in any single filter
- Classifiers only as good as their training data and their loss function.

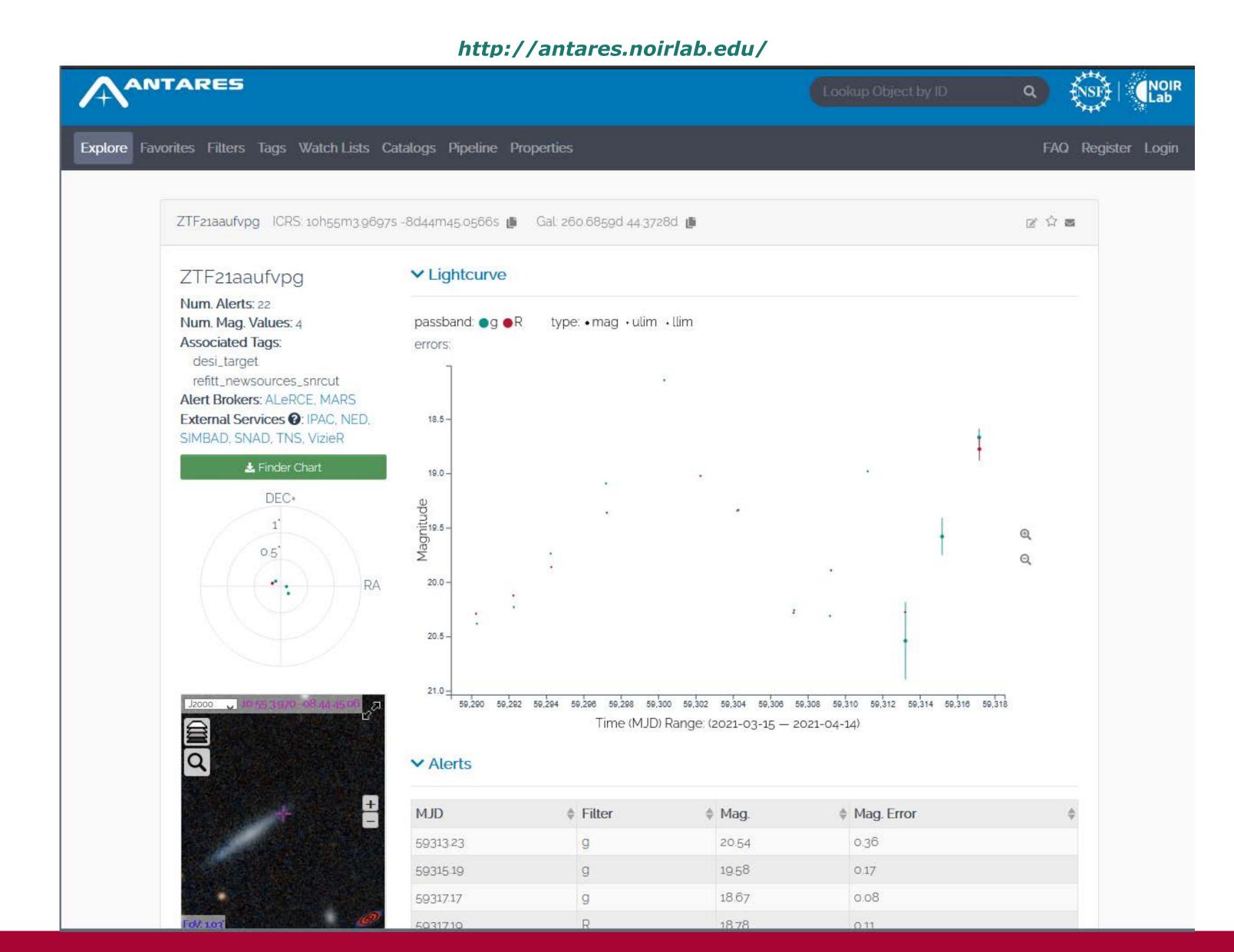
# (Some known) shortcomings of v1

# What tells you that 21jap at right is real?

Simply, flat light curves with full phase coverage aren't a realistic model for how the science collaborations will interact with LSST data

No host galaxy information, postage stamps, or alerts

Surveys cannot afford to act independently



# Goal for PLAsTiCC v2 (~September 2021)



To evaluate\* real-time Broker performance on a realistic LSST alert stream.

### **Broker Roles**

- Storing, processing, classifying alerts, informing follow-up
- Potential additional roles:
  - Collecting active source features
  - Maintaining source databases

### **Alert Stream**

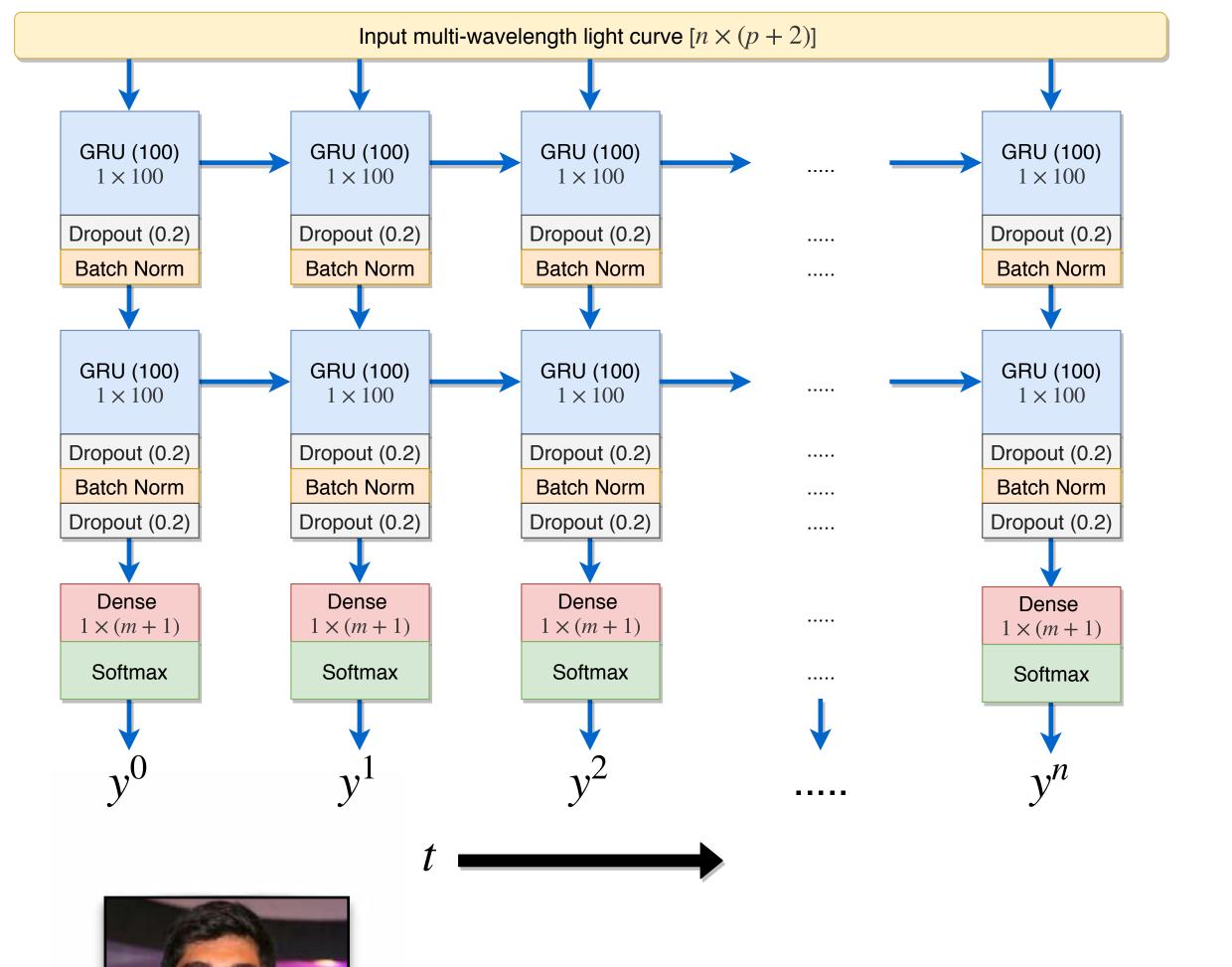
- Set of simulated LSST-like alert packets
- must preserve environmental correlations
- Should contain a representative sample of expected events

Iterative process to ensure compatibility between brokers and alert stream.

\*metrics in progress!

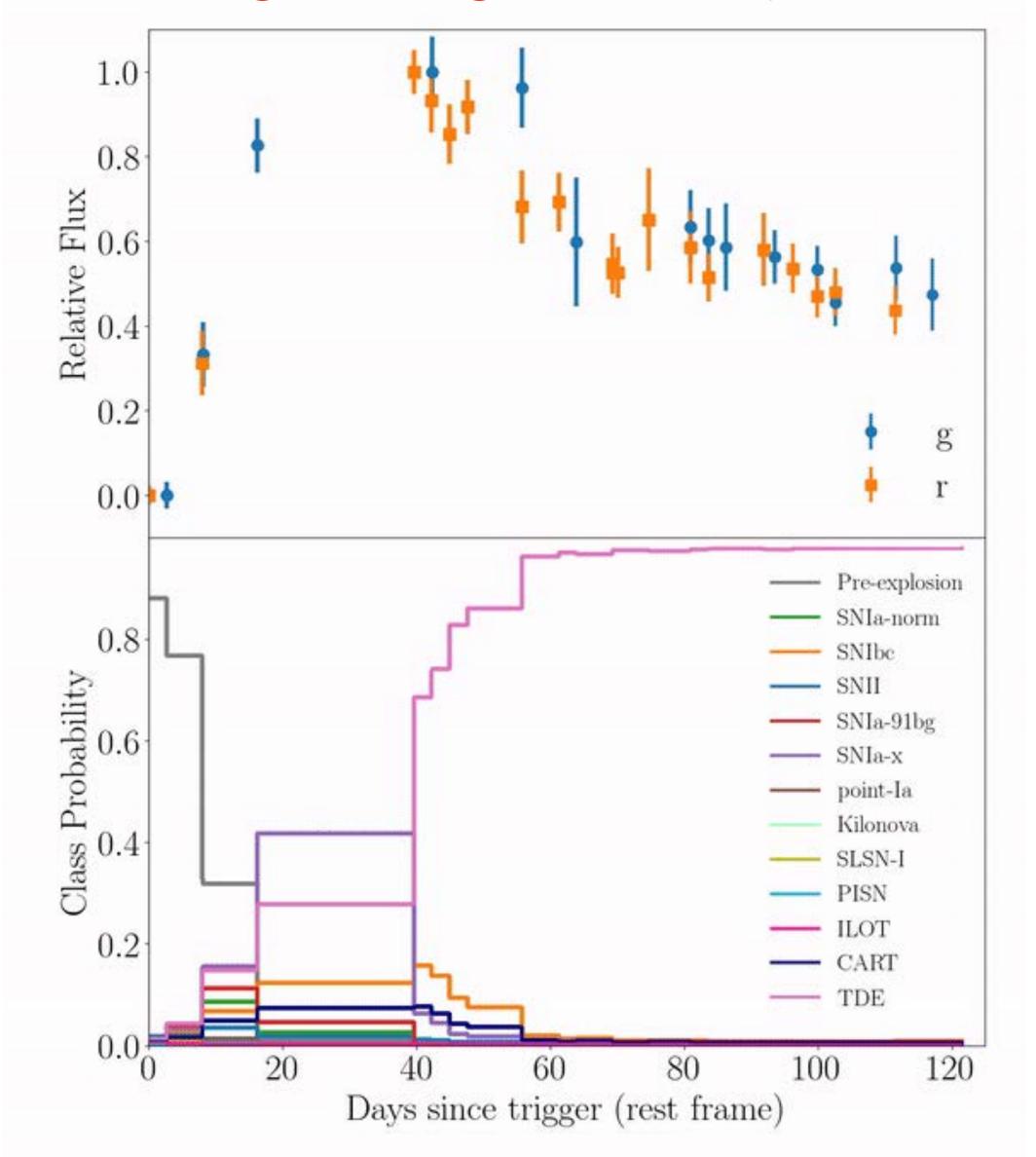
### RAPID: REAL-TIME AUTOMATED PHOTOMETRIC IDENTIFICATION

### DEEP LEARNING TO IDENTIFY TRANSIENTS EARLY!





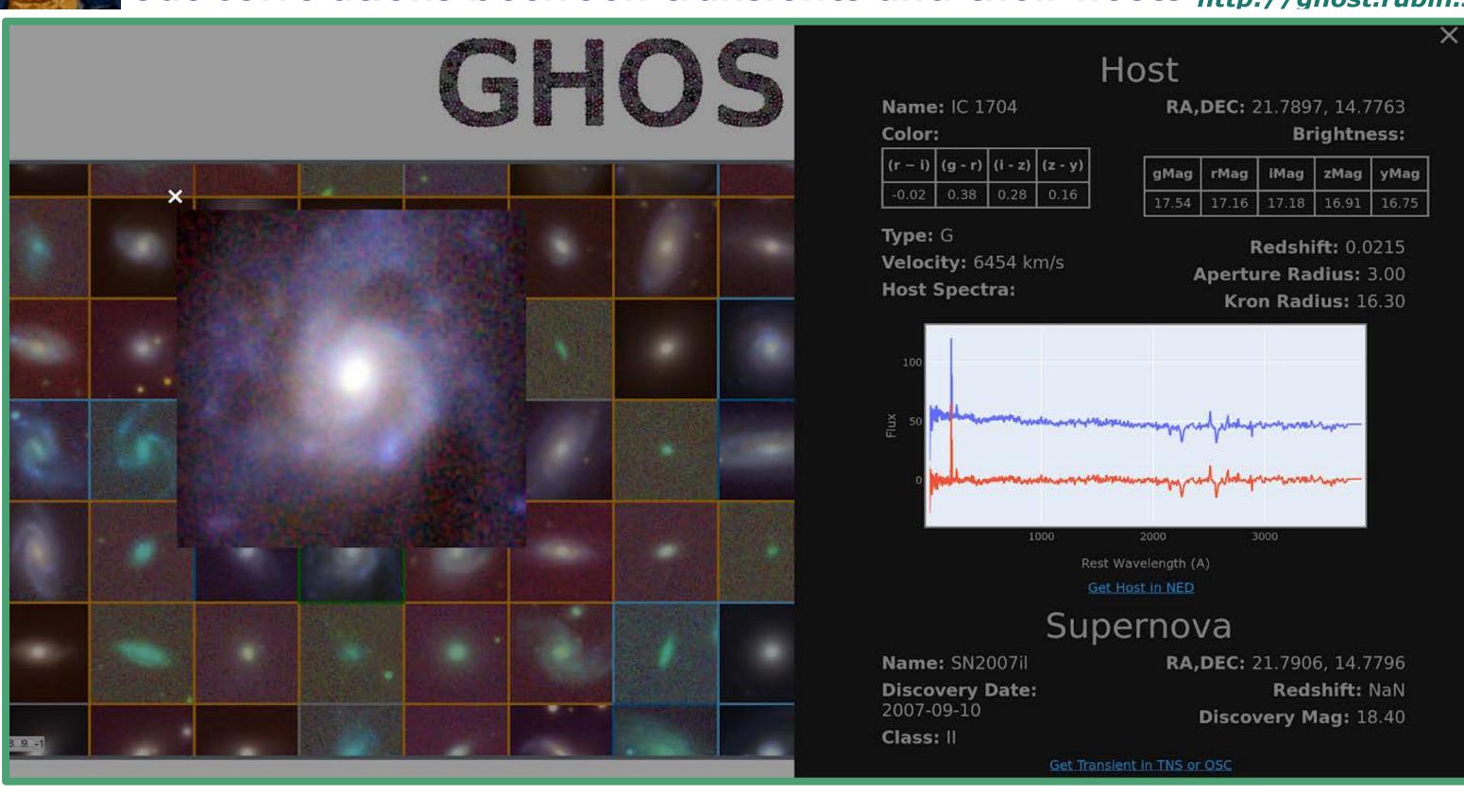
\*\*Dr.\*\* Daniel Muthukrishna (Cambridge)
uses the same tech in predictive text to predict
light curve behavior

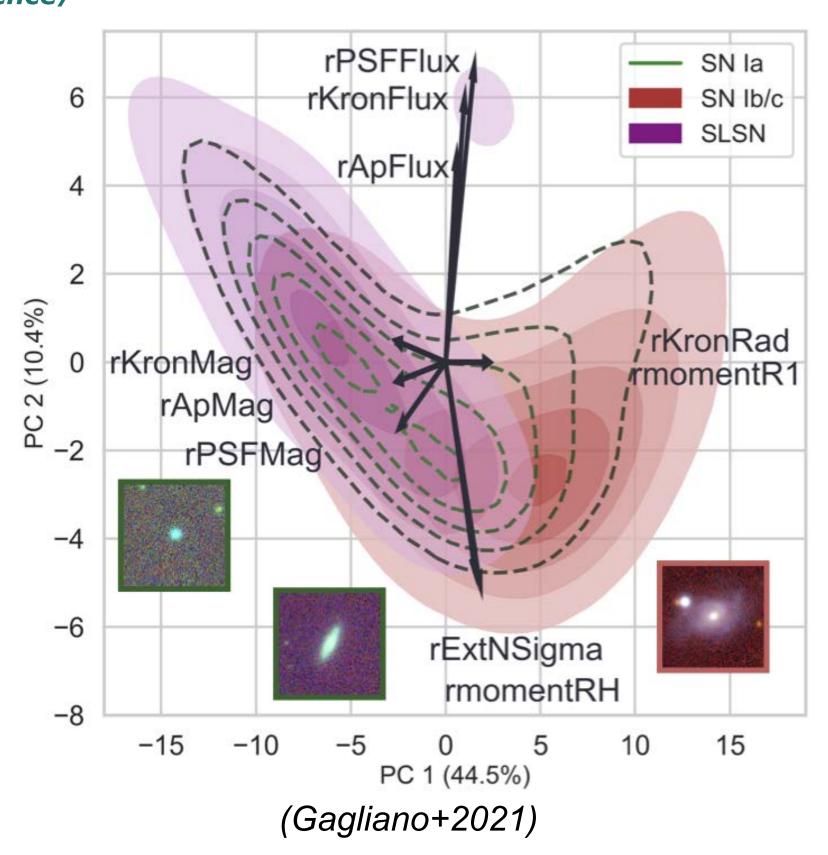


## Galaxies HOsting Supernovae and other Transients

Alex Gagliano (UIUC, NSF Fellow) figures

out correlations between transients and their hosts http://ghost.rubin.science/





- 16,228 SNe-host galaxy pairs: 78% of unique events reported on TNS/OSC.
- PS1,NED photometric & derived properties (color, redshift, radial moments)

# v2: Simulating Transients & Hosts

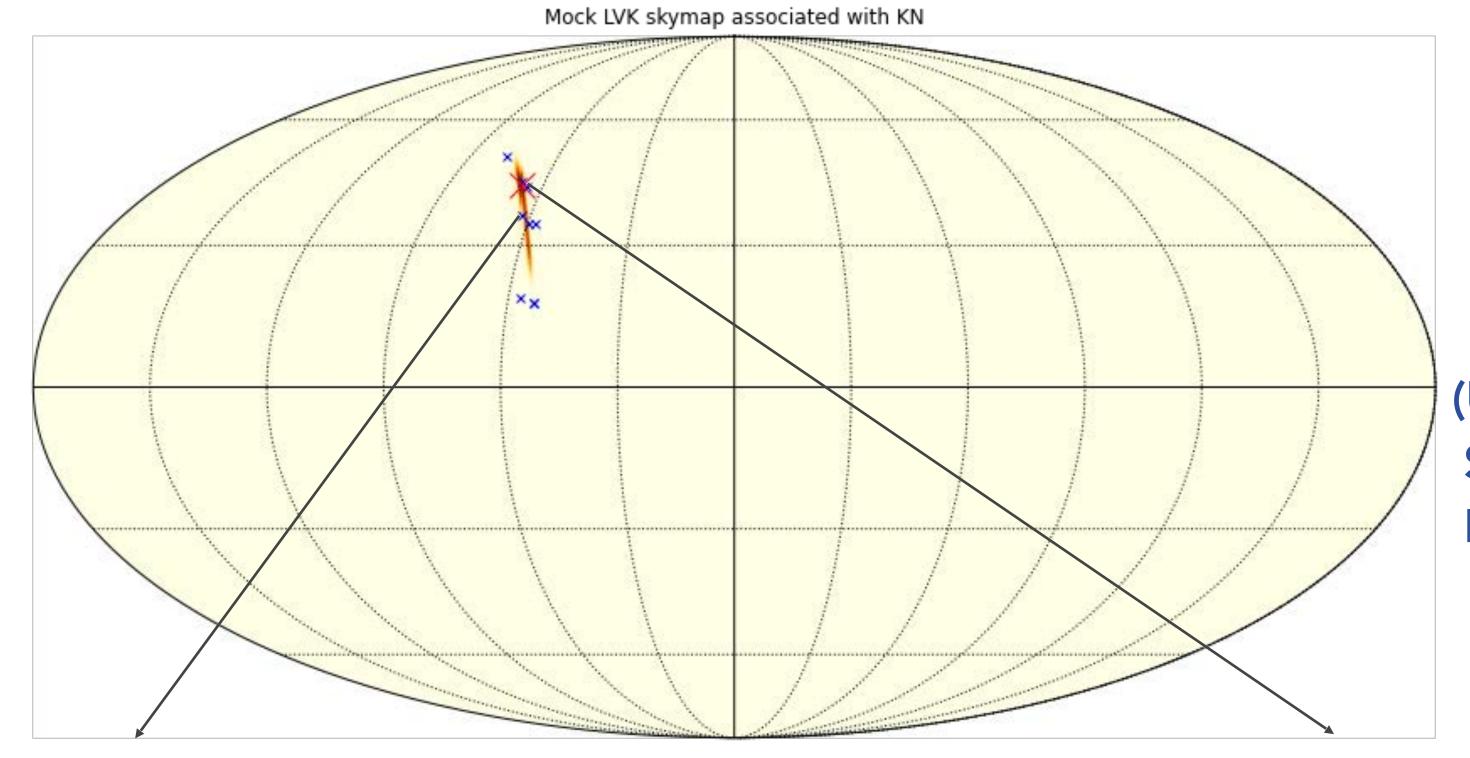
(Abolfathi+2021)

Simulation Validation Pre-processing **GHOST EmpiriciSN** 16.5k SNe, host Simulated **SNANA Brokers** galaxies transient Simulated arXiv:2008.09630 ANTARES parameters transient Gagliano+2021 arXiv:1611.00363 Pitt - Google photometry Holoien+2016 ALeRCE (with host LASAIR galaxy 0110010 0001101 Fink properties) cosmoDC2 **AMPEL** arXiv:0908.4280 **DESC Synthetic** Kessler+2009 MARS Sky Catalog INAF broker **LIGO** arXiv:1907.06530 01111 10110 10000 Fritz Localized Event Skymaps Korytov+2019 Babamul D. Chatterjee South African broker team 9000100001011000010110001100001 NYU Anomalies (Oluseyi+2012) SNAPS **UW** Genesis v2 Alert Stream

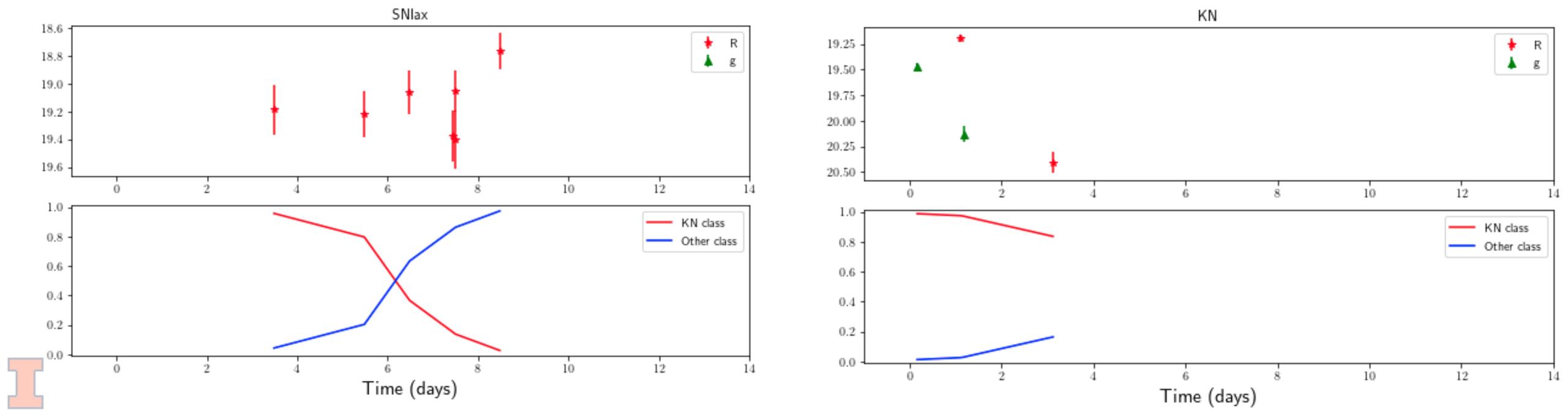


# El-Cid

Electromagnetic Counterpart Identification

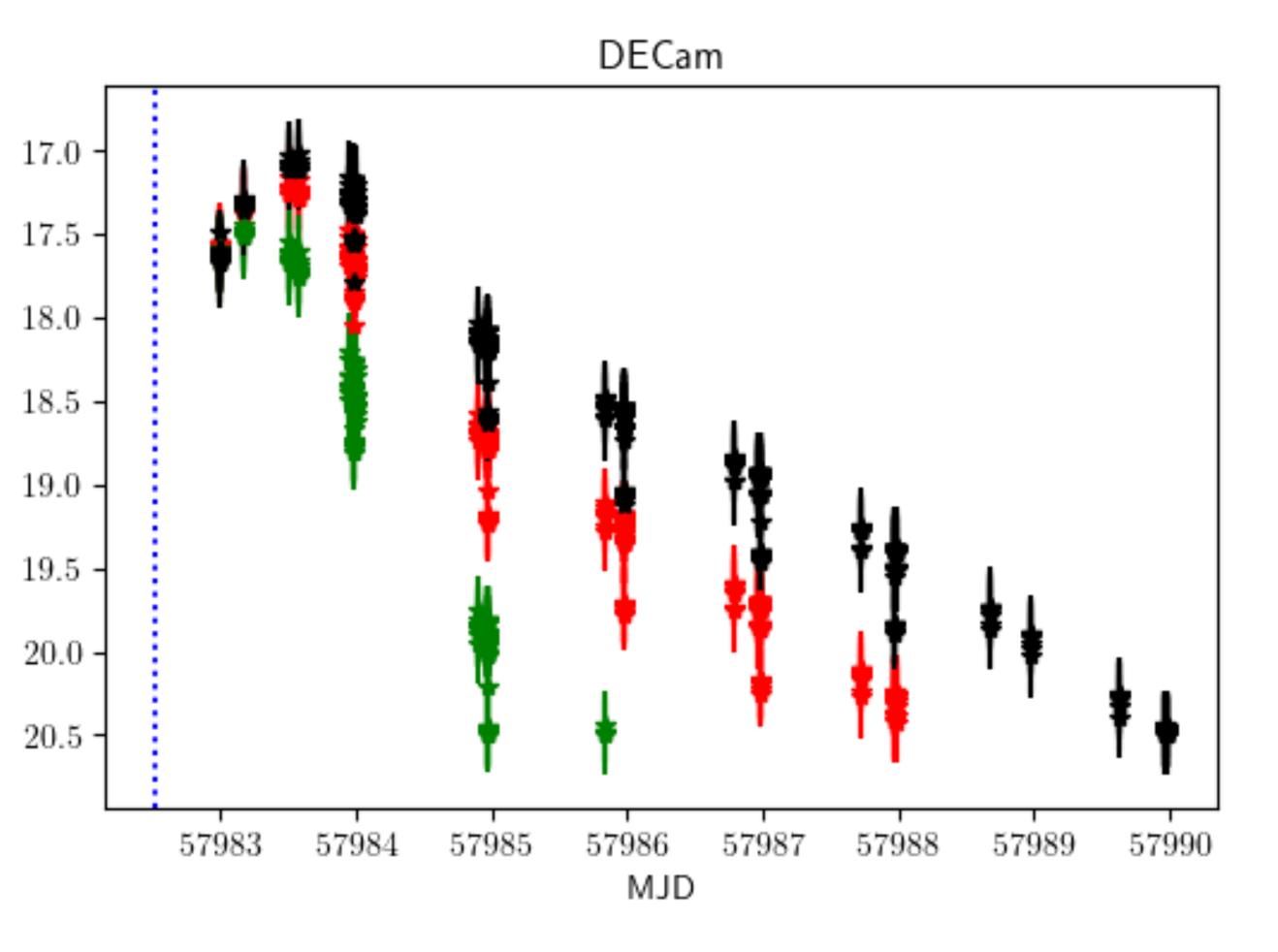


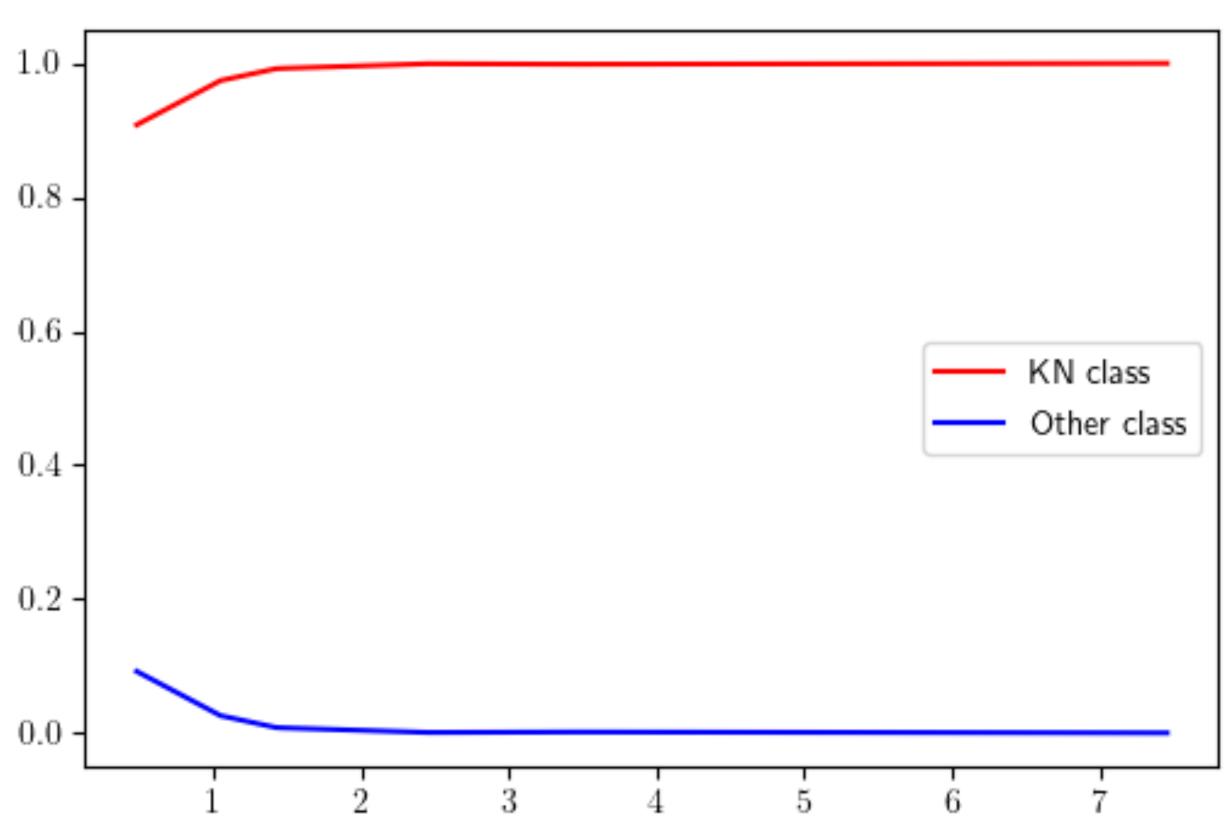




# Performance on GW170817





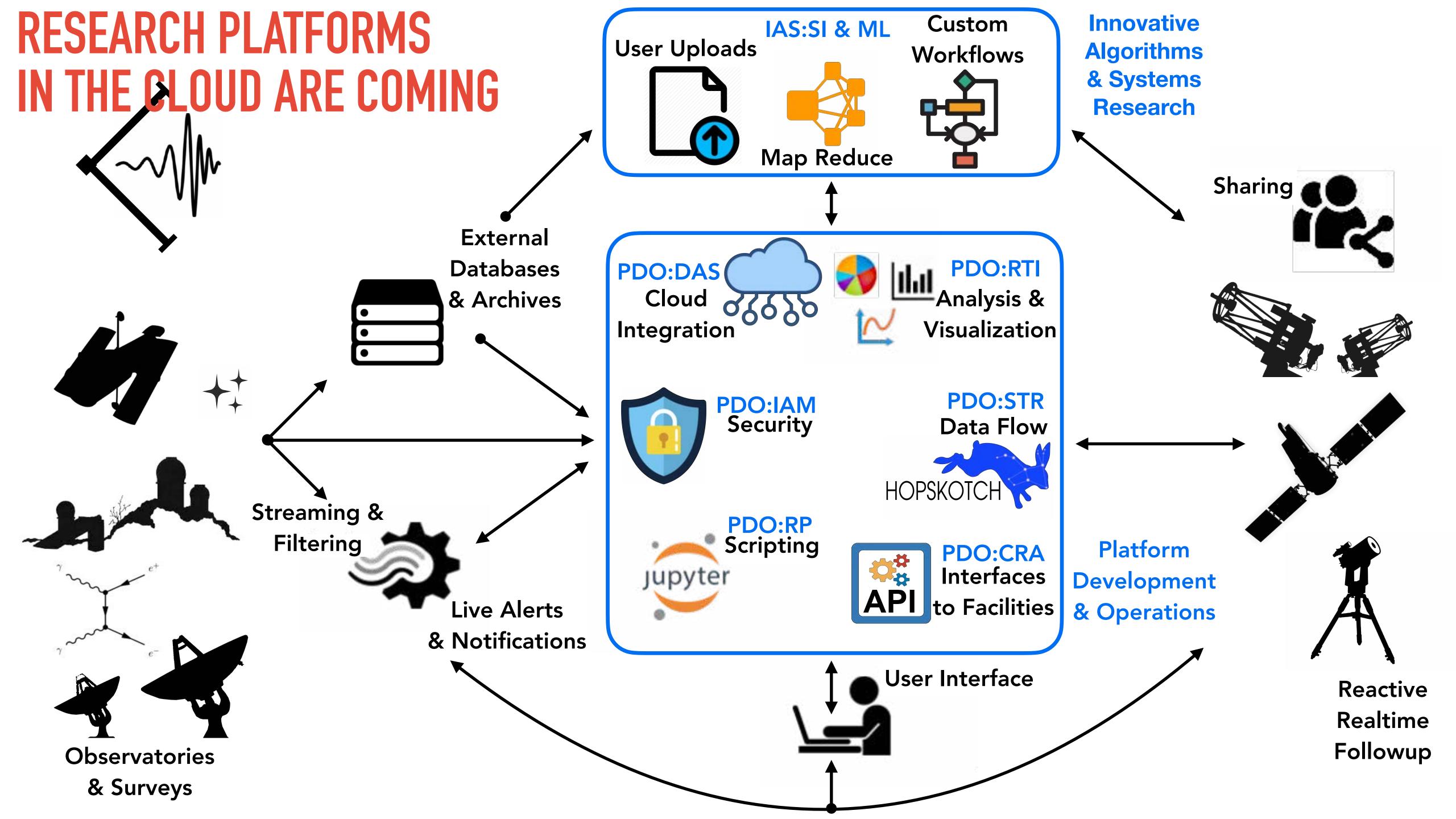


# HOW CTA CAN ENGAGE 5:

# EVERY SURVEY CREATES LARGE SIMULATIONS OF WHAT THEY EXPECT TO SEE TO TEST SURVEY DESIGN

THIS NEED NOT BE JUST INFRASTRUCTURE WORK, AND CAN REALLY ENGAGE THE COMMUNITY SCIENTIFICALLY - E.G. PLASTICC

PLASTICC V2 ALREADY INCLUDES LVK AND LSST. V3 COULD HAVE THE CTA SKY WE'D LOVE TO WORK WITH YOU!



- LSST and CTA both build on current-generation surveys to discovery many new sources
- Maximizing scientific utility from these experiments requires providing data in real-time
  - Get away from just the concept of an archive with periodic data releases!
- Alert brokers are a key tool for this and give the community ways to search, characterize, filter, and follow-up events
  - They enable machine learning in real-time for astrophysical surveys
- There are already de facto standards for alert format and systems to stream them, as well as existing brokers you don't have to start from zero!!!
  - As CTA builds out it's pipeline, and creates simulations for survey design, interact with broker teams and the scientific community and define interesting questions that also spur infrastructure development
- The best science will come from combining real-time streams from several experiments challenge but also a tremendous opportunity