### From historical records to modern time-domain surveys

The Variable Universe – Lecture 01 Fall Semester 2021

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Sauverny Observatory #265



### A few introductory words

- Standard Candles and Distances Group @ IPHYS (GR-ANDERSON)
- We combine stellar physics with cosmological application: measure accurate distances to determine Hubble constant
- TP4b / Master projects available!
- www.epfl.ch/labs/scd
- Richard.Anderson@epfl.ch
- 022 379 24 25







### Course Overview

L01: from historical records to large time-domain surveys

LO2: Variability across the Solar system

L03: Extrinsic stellar variability

LO4 & LO5: Intrinsic stellar variability (eruptive & pulsations)

L06: Exoplanets

L07: Transients

LO8: Degenerate objects (white dwarfs, neutron stars)

L09: Active galaxies

L10 & L11: Multi-messenger astronomy (neutrinos, grav. waves)

L12: Cosmic distances & expansion

L13 & L14: Applications for fundamental physics and cosmology

#### **Course Goals**

- Develop a "time-domain mindset"
- Get inspired by variability applications in astrophysics & cosmology
- Understand basics of time-domain data analysis techniques
- Become familiar with the growing landscape of time-domain surveys, strategies & instrumentation
- Practice synthesizing info from articles outside your specialization
- Foster your presentation skills
- Have fun engaging with research close to the bleeding edge!

### Course mentality / setup

- Do interrupt!
- Do take notes!
- Streaming is offered, but presence is better
- Online = video ON!
- Exercises (1h) after lectures
- Feedback wanted (good & bad)
- Moodle page: https://moodle.epfl.ch/course/view.php?id=16823

#### **Exercises**

- Please show up & participate!
- 1h after lecture
- Important to process course material
- Main idea:
  - All read same article during week after lecture
  - Next exercise: Informal 15 min presentation & guided group discussion
- This means
  - Two (journal club-style) paper presentations per student
  - Little preparation needed for exam
- Please sign up via link on Moodle page (PHYS-643)

#### **Exam modalities**

- Oral 30-min exam during regular exam session:
  - Between 23 Jan 23 and 3 Feb 23
  - Counts 100%
- Composition of grade:
  - 50%: 10-minute presentation of a paper discussed during exercises
  - 50%: Q&A following presentation & discussion of course content

### Any questions?



Why do time-domain astronomy?

### Questions

- Who among you works with time-domain data?
- What kinds of objects are you studying?
- What kind of variability timescales?
- What kind of data do we use?
- Outside of your field: where is time-domain important?

### What defines time-domain astronomy?

- Distinction between "classical" variability studies and transient astronomy (transition: periodic phenomena -> any changes with time)
- All objects change on some timescale: variations & changes ubiquitous
- Today: a limited overview of astronomical surveys with timedomain connections
- Following lectures: different types of astrophysical applications, and then we will end with applications for fundamental physics and cosmology

### Time domain is sexy & essential!



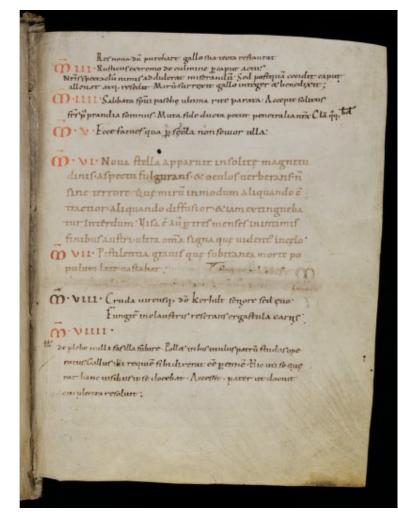
- All 5 astro-related physics Nobel prizes in past decade (2011 -2020) directly employed time domain observations!
   Accelerated Universe, Neutrino Oscillations, Gravitational Waves, Exoplanets, Black Holes
- 2002: X-ray astronomy & neutrino detections [Sun & SN1987A]
- 2006: CMB anisotropy; no direct time-domain connection

The time-domain partially makes up for the passivity of astronomy as an observational science: it allows us to see the same surface of a rotating star at different times, or to gain statistical insights into rare phenomena, such as stellar explosions

# A (too short) history of time-domain astrophysics

### A brief history of variability

- "Guest stars" possibly as early as 4500 BCE in Kashmir
- Algol may have been known to early Egyptians
- Earliest record of supernova in China 185 CE
- Earliest Swiss record in St Gall (SN1006), peak -7.5mag
- Tycho's star (SN1572) & Kepler's Star (1604) within a generation, no Galactic SN observed since!
- Mira [o Ceti] : the first variable star Fabricius (1596) : Nova, Holwarda (1638) : 11 months
- Edward Pigott & John Goodrick (1784)
   <a href="https://wonderdome.co.uk/goodricke-pigott-algol-cepheids/">https://wonderdome.co.uk/goodricke-pigott-algol-cepheids/</a>



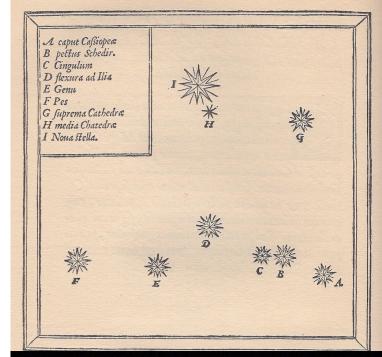
[i]n a wonderful manner this was sometimes contracted, sometimes diffused, and moreover sometimes extinguished ... It was seen likewise for three months in the inmost limits of the south, beyond all the constellations which are seen in the sky

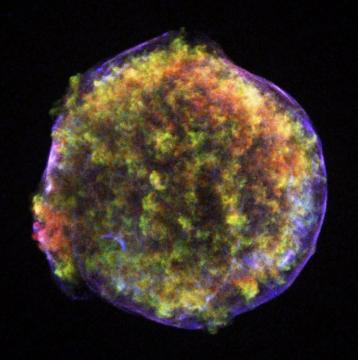
### 19th Century: variable stars!

- Friedrich Wilhelm Argelander (1799 1875): astrometry, variable star systematic studies, Bonner Durchmusterung (last w/out photography)
- Charles Pickering (1846 1919): photographic spectroscopy: binaries, coordinated follow-up

Table 4. Variables discovered by 1796.

Name	Year	Type	Period	Spectrum	Discoverer	
o Ceti	1596	Mira	372	M5e-M9e	Fabricius	
β Persei	1667	EA	2.87	B8V	Montanari	
χ Cygni	1686	M	408	S6.2e-S10.4e	Kirch	
R Hydrae	1704	M	384	M6e-M9e	Maraldi	
R Leonis	1782	M	310	M6e-M9.5IIIe	Koch	
β Lyrae	1784	EB	12.9	B8II-IIIep	Goodricke	
η Aquilae	1784	δ Сер	7.18	F6Ib	Pigott	
δ Cephei	1784	δ Сер	5.37	F5-G1Ib	Goodricke	
R CrB	1795	RCB	_	G0Iep	Pigott	
α Herculis	1795	SRc		M5Ib-II	W. Hersche	
R Scuti	1795	RVa	147	G0Iae-K2pIbe	Pigott	



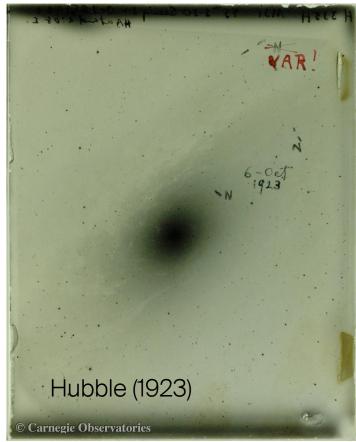


### 20th Century: categorizing

н.	Max.	Min.	Epoch.	Period.	Res. M.	Res. m.	H.	Max.	Min.	Epoch.	Period.	Res. M.	Res. m
			d.	d.						d.	d.		
1505	14.8	16.1	0.02	1.25336	-0.6	-0.5		14.1	14.8	4.0	6.650	+0.2	-0.3
1436	14.8	16.4	0.02	1.6637	-0.3	+0.1	1355	14.0	14.8	4.8	7.483	+0.2	-0.2
1446	14.8	16.4	1.38	1.7620	-0.3	+0.1	1374	13.9	15.2	6.0	8.397	+0.2	-0.3
1506	15.1	16.3	1.08	1.87502	+0.1	+0.1	818	13.6	14.7	4.0	10.336	0.0	0.0
1413	14.7	15.6	0.35	2.17352	-0.2	-0.5	1610	13.4	14.6	11.0	11.645	0.0	0.0
1460	14.4	15.7	0.00	2.913	-0.3	-0.1	1365	13.8	14.8	9.6	12.417	+0.4	+0.2
1422	14.7	15.9	0.6	3.501	+0.2	+0.2	1351	13.4	14.4	4.0	13.08	+0.1	-0.1
842	14.6	16.1	2.61	4.2897	+0.3	+0.6	827	13.4	14.3	11.6	13.47	+0.1	-0.2
1425	14.3	15.3	2.8	4.547	0.0	-0.1	822	13.0	14.6	13.0	16.75	-0.1	+0.3
1742	14.3	15.5	0.95	4.9866	+0.1	+0.2	823	12.2	14.1	2.9	31.94	-0.3	+0.4
1646	14.4	15.4	4.30	5.311	+0.3	+0.1	824	11.4	12.8	4.	65.8	-0.4	-0.2
1649	14.3	15.2	5.05	5.323	+0.2	-0.1	821	11.2	12.1	97.	127.0	-0.1	-0.4
1492	13.8	14.8	0.6	6.2926	-0.2	-0.4							

Leavitt & Pickering (1912)

- Harvard "computers"
  - Henrietta Leavitt; Harvard Variables:
     <a href="https://library.cfa.harvard.edu/variable-stars">https://library.cfa.harvard.edu/variable-stars</a>
  - Williamina Paton Fleming; <a href="https://library.cfa.harvard.edu/fleming-work">https://library.cfa.harvard.edu/fleming-work</a>
  - Dorrit Hoffleit: bright star catalog, very important mentor for female astro PhDs; <a href="https://www.cwhf.org/inductees/dorrit-hoffleit">https://www.cwhf.org/inductees/dorrit-hoffleit</a>
  - Henrietta Hill Swope: 275 Cepheids in M31 (Baade & Swope 1964)
- Leavitt, then Hubble: extragalactic variables!
- American Association of Variable Star Observers (AAVSO) founded 1912
- Rapid progress with invention of CCDs
- Extensions beyond visible EM



### Towards the first sky surveys

- 1950s: Palomar Observatory Sky Surveys, POSS I & II
- DPOSS -> 3TB digitized version of POSSII (>50 million galaxies & 1 billion stars)
- Sloan Digital Sky Survey (SDSS): CCD-based survey
- 2MASS: first all-sky NIR survey
- Ever wider, deeper, more colors
- Identify interesting objects, follow them up later with larger infrastructure
- Statistical studies (large scale structure, MW structure, etc.)

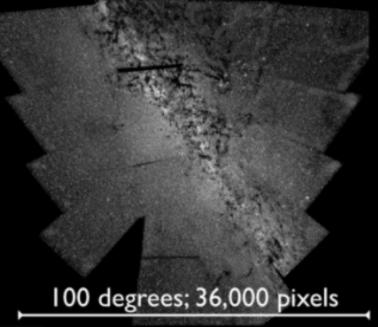


# Variability surveys across the electromagnetic spectrum

### Ground-based photometric







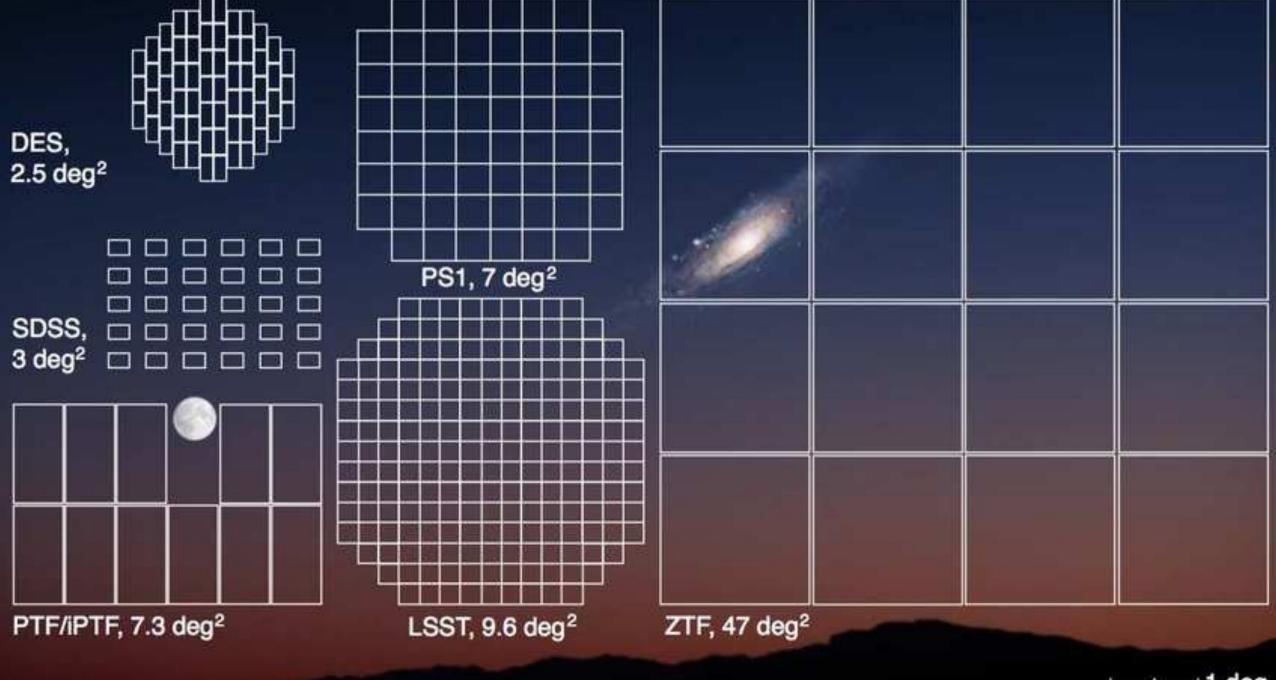


### First-generation microlensing surveys of the 90s: MACHO, EROS, OGLE

- 1m class telescopes with fast CCD cameras pointed at Magellanic Clouds
- MACHO (US & AUS):
  - Biggest camera of the 90s: 16 Mpix, 42x42' FoV, simultaneous color (dichroic)
  - First strong detection of microlensing of star, 1993
  - First real-time alert of ongoing microlensing, 1994
  - First observation of parallax in microlensing, 1995
- EROS (FR) Experience pour la Recherche d'Objets Sombres
- OGLE (PL) Optical Gravitational Lensing Experiment
  - Most succesful of them, ongoing: OGLE-IV
  - hugely important for stellar astrophysics and Magellanic clouds

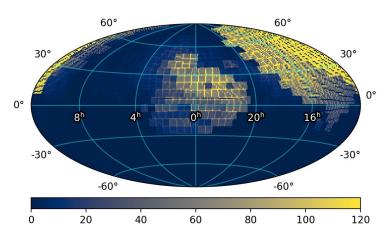


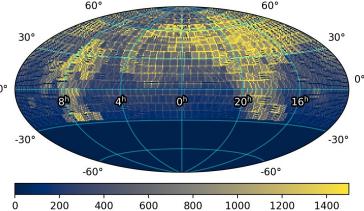
## OGLE IV Sky Coverage Galactic bulge Galactic disk Wadellauic pridge

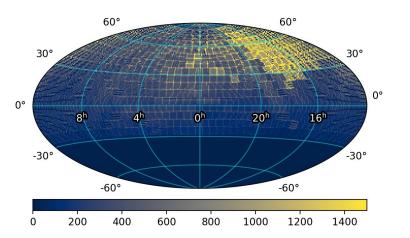


### The Zwicky Transient Facility

- 48in (1.2m) Schmidt telescope @ Mt Palomar
- Full Northern sky every 2 nights (1"/pix)
- 47 deg^2; 1"/pix; 20.4 mag limit
- 4 x 4 array of 6k x 6k CCD = 600 Mpix
- ZTF g, r, i filters
- Bi-monthly data releases
- Sep 2022: 41.7 M exposures, 4.37 bn light curves
- www.ztf.caltech.edu/page/dr7

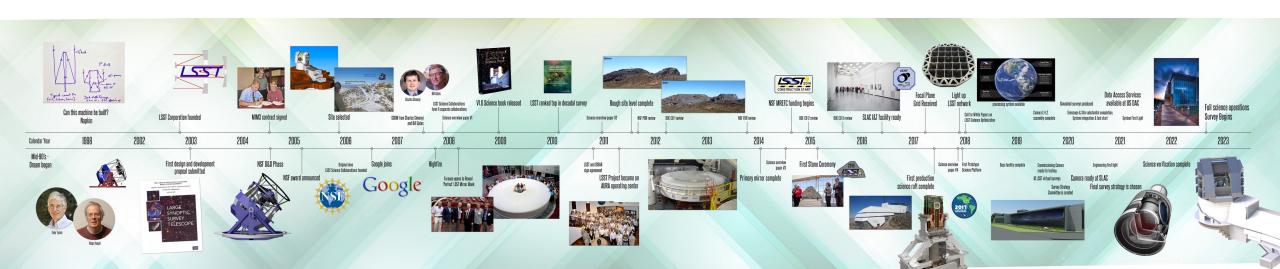






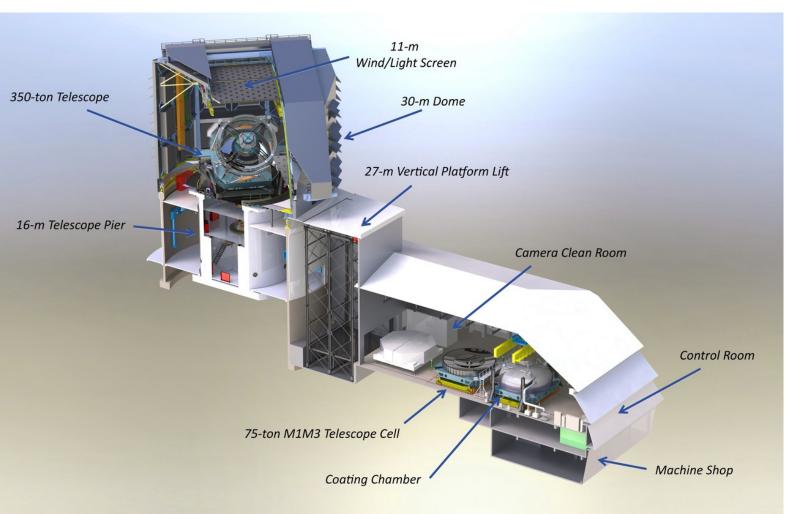
### Vera C. Rubin Observatory / LSST

- 8.4m telescope in Chile dedicated to survey
- 3.2 Gpix camera, FoV 3.5deg (9.6 sq deg) = 40\* full moon FoV; full sky every few nights
- 0.2"/pixel, standard texp 2x15sec
- 10 year survey, 37 bn stars & galaxies
- Each night: 20 TB of data, 10 M alerts, 1000 exposure pairs
- Final dataset: 500 PB (images & data products); 11 data releases
- https://www.lsst.org/scientists



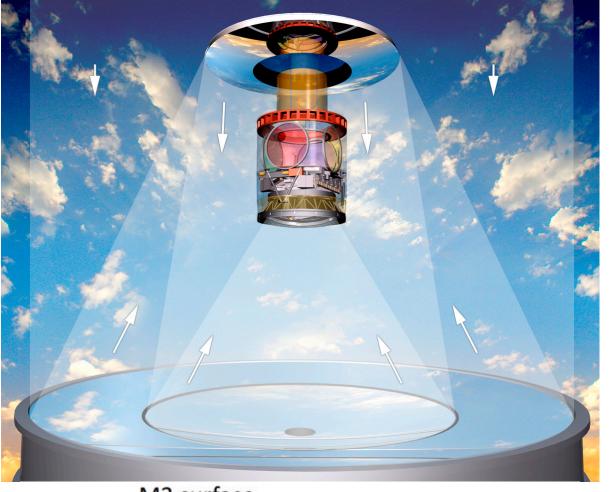
### Rubin's Legacy Survey of Space and Time

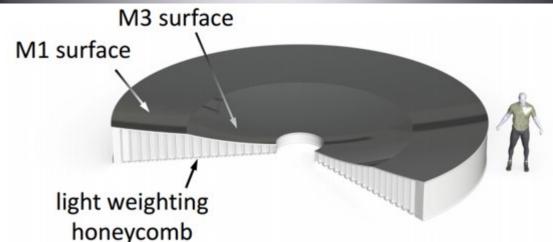
https://lsst.slac.stanford.edu/



- Dark energy & matter
- Solar System Inventory
- Transient optical sky
- Mapping Milky Way











#### Field of View

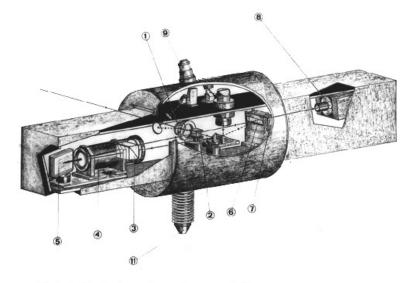
#### Resolution



# Spectroscopic surveys are entering the time-domain

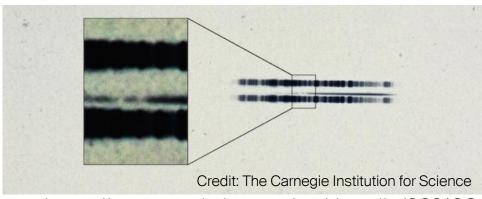
### From photographic slit spectra to robotic fiber surveys

- Initially slit spectroscopy on photographic plates
- Line of sight velocities by comparing individual line positions
- 1970s: physical correlation instrument
- 1990s: fiber optics revolutionize spectroscopy
- 1997: 2dFGRS with fiber positioning system
- 2000: Sloan Digital Sky Survey (SDSS)
- LAMOST (since 2010s)
- Most not optimized for time-domain (yet)



- l Fente d'entrée du spectrographe
- 2 Lame de balayage
- 3 Prisme à vision directe
- 4 Collimateur
- 5 Réseau échelli

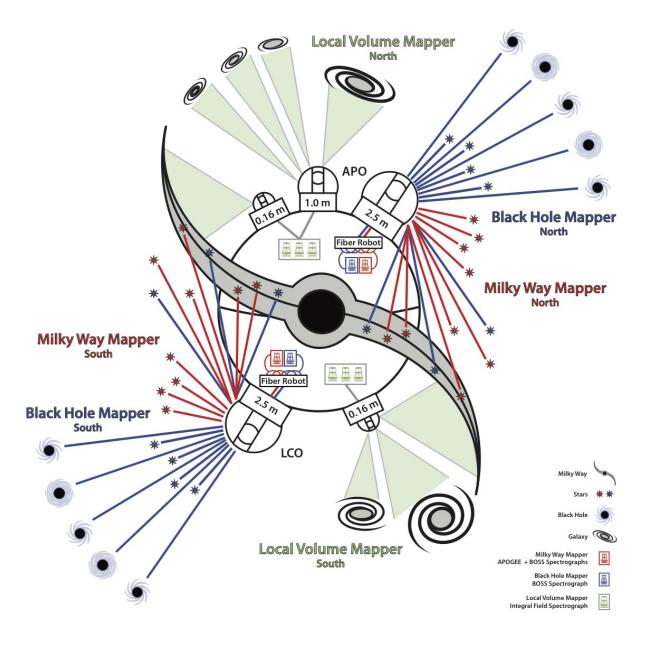
- 6 Masoue
- 7 Lentille de Fabr
- 8 Photo détecteur
- 9 Viseur de fente et de champ
- 11 Lampe de calibration



https://www.eurekalert.org/multimedia/669108

### Ground-based spectroscopic





### Fast focal plane sampling w/ robotic fiber positioners

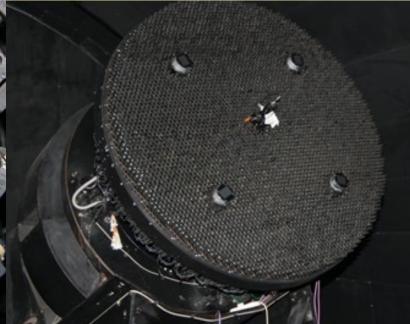
EPFL contribution to SDSS-V:

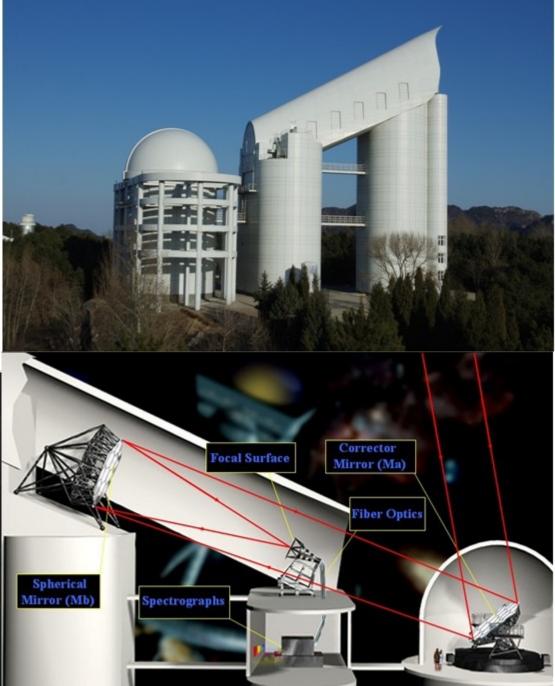
https://player.vimeo.com/video/519959391

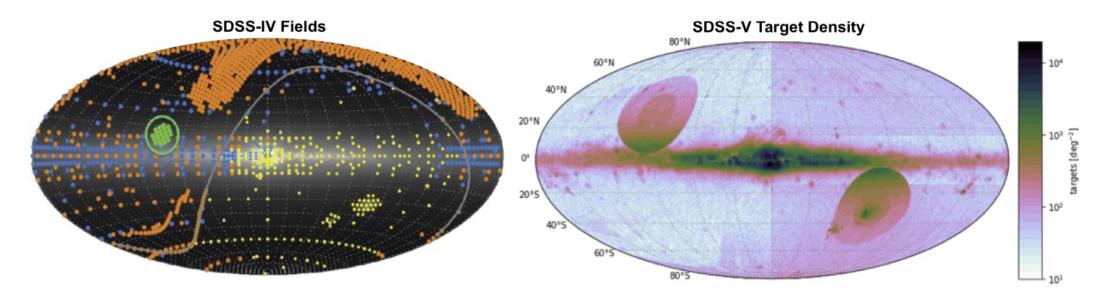


### LAMOST

Large Sky Area Multi-Object Fibre Spectroscopic Telescope







Program	Science Targets	N <sub>Objects</sub> and/or Sky Area	Primary Spectral Range and Hardware	<b>Primary Science Goals</b>
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 contiguous spectra over 3,000 deg <sup>2</sup>	Optical; new integral field spectrographs covering 3600-10000Å at $R \sim 4000$	Exploring galaxy formation and regulation by star formation; feedback, enrichment, & ISM physics

stars per (100 pc)2

#### Ongoing or upcoming spectroscopic surveys

- **DESI** Dark Energy Spectroscopic Instrument (5000 fibers, medium res 360 980nm)
- 4MOST 4-meter Multi-Object Spectroscopic Telescope
   (2435 fibers, 2.5 deg diameter FoV, medium/high res, ESO VISTA)
- MOONS Multi-Object Optical and Near-infrared Spectrograph (1000 fibers, 500 arcmin^2, moderate & high res, ESO UT1)
- WEAVE WHT Enhanced Area Velocity Explorer
   (1000 fibers, medium/high res, 2 deg diameter FoV, La Palma)
- MSE Mauna Kea Spectroscopic Explorer (proposed 11m replacement of CFHT)
- And several other proposed projects for LSST follow-up

### Space-borne facilities

The benefits of leaving the atmosphere

# INTEGRAL: ESA's INTErnational Gamma Ray Astrophyscis Laboratory

- Targets's gamma ray sources since Oct 2002
- 15 keV 10 MeV spectroscopy (E/dE = 500) and imaging (12' FWHM)
- 4 35 keV X-ray monitoring & V-band (550nm) monitoring
- Switzerland hosts center for scientific data at ISDC, part of UniGE astro department
- Most sensitive gamma-ray instrument before FERMI
- Heaviest payload launched by ESA (2019):
   5m tall, 4 tons heavy
- Weekly scans of galactic plane
- www.cosmos.esa.int/web/integral/pom-archive

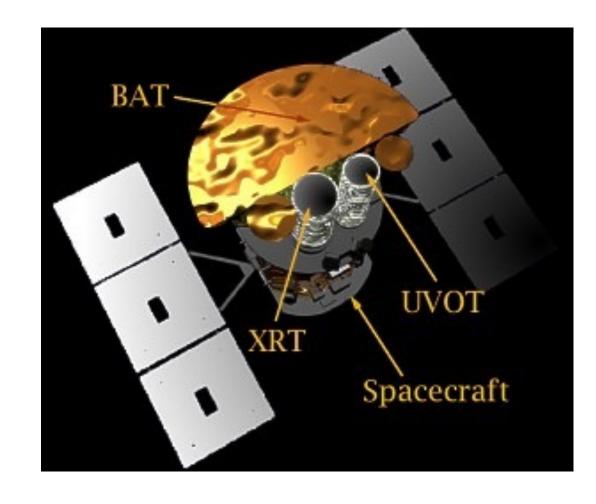




Jump where it's interesting: the Neil Gehrels SWIFT observatory

## **Neil Gehrels Swift Observatory**

- Launch: 2004
- 2 yr mission but still active!
- 100 GRBs / yr -> currently almost 1500
- Very fast slewing capability: 20-70s to target
- Gamma-ray (BAT), X-ray (XRT), UV & optical (UVOT) imaging
- BAT wide angle burst alert
- Then follow-up with X-rays & UV + optical
- Immediate image downlink for follow-up
- Astronomerstelegram.org



# Ground-based follow-up

Previous | Next | ADS

#### A Neil Gehrels Swift Observatory Snapshot of the Black Hole Candidate XTE J1908+094

ATel #12632; J. M. Miller, M. Reynolds, B. Tetarenko, S. Ali, M. Balakrishnan, J. Chen, D. Vozza (University of Michigan)

on 5 Apr 2019; 21:53 UT

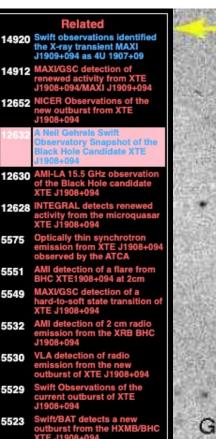
Credential Certification: Jon Miller (jonmm@umich.edu)

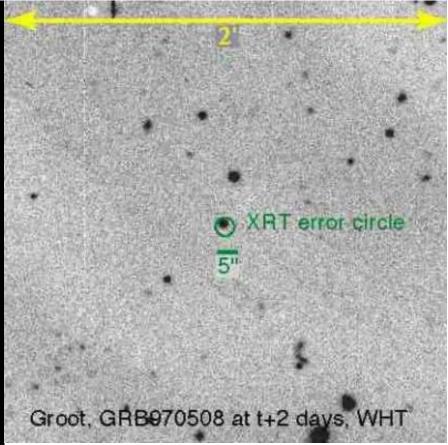
Subjects: X-ray, Black Hole, Transient

Referred to by ATel #: 12652, 14912

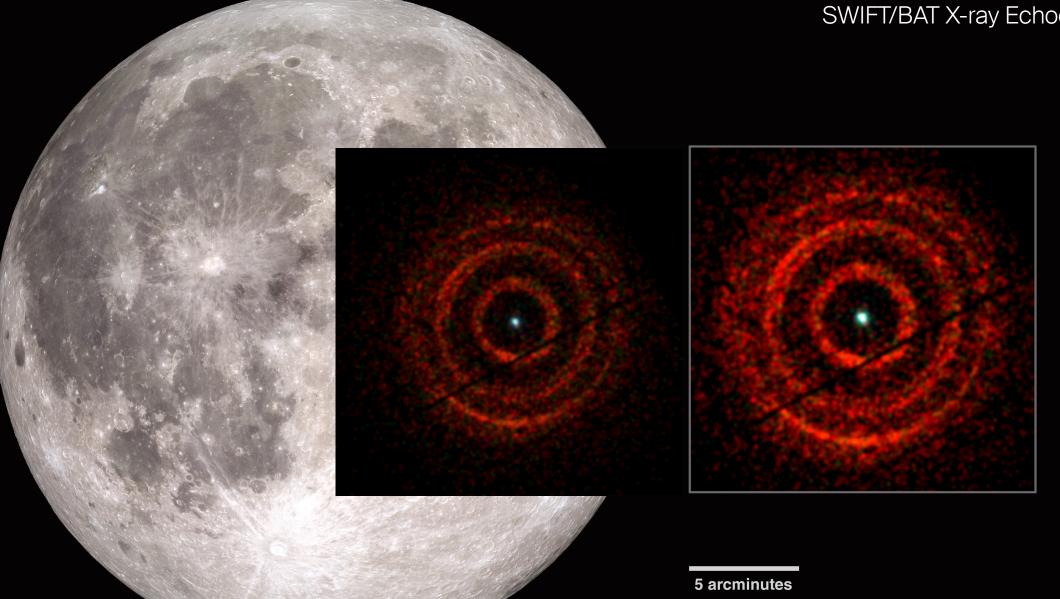


XTE J1908+094 is a black hole candidate and recurrent transient. During its 2013 outburst, complex, relativistic radio jets were resolved with the VLBA and EVN (Rushton et al. 2017). A preliminary black hole spin measurement of a = 0.75 +/- 0.09 was obtained based on modeling of BeppoSAX spectra (Miller et al. 2009; also see in't Zand et al. 2002); subsequent studies during the 2013 outburst did not achieve the sensitivity required to update this measurement (Tao et al. 2015, Zhang et al. 2015).



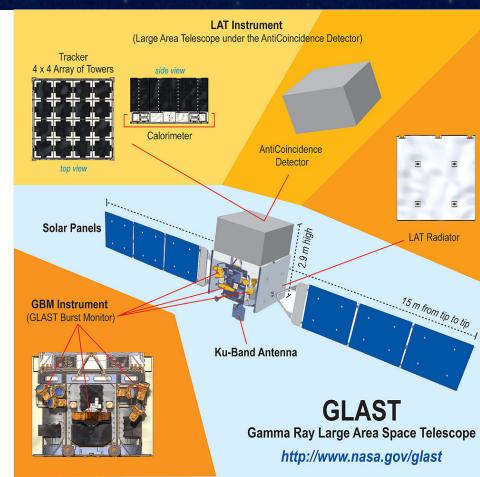


#### SWIFT/BAT X-ray Echoes of V404 Cyg

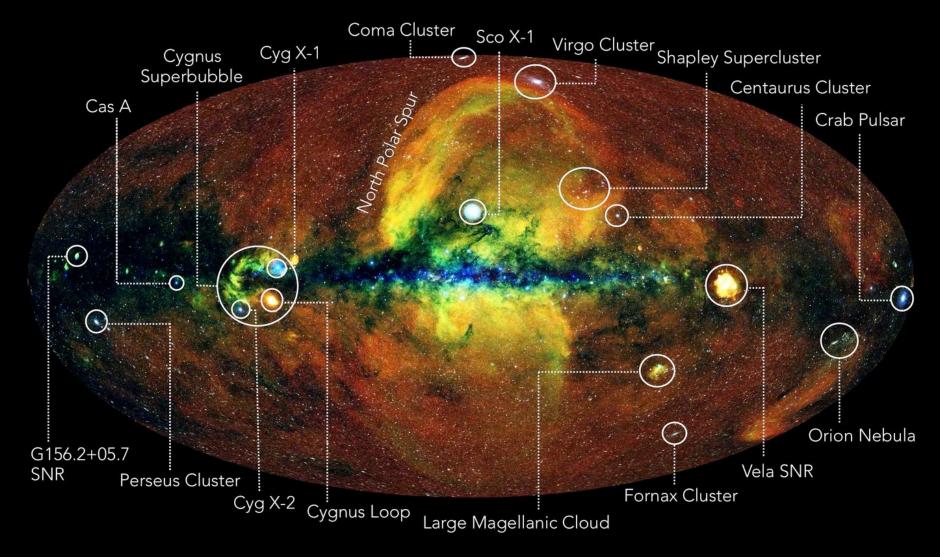




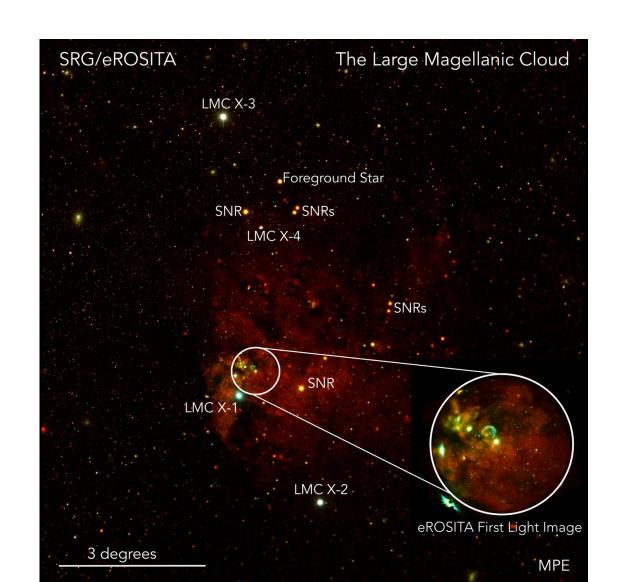
- INTEGRAL successor, launched in 2008
- Most sensitive gamma-ray instrument
- 8 keV to 300 GeV (VHE gamma rays)
- Fermi bubbles in MW
- GW170817 GRB counterpart to gravitational waves

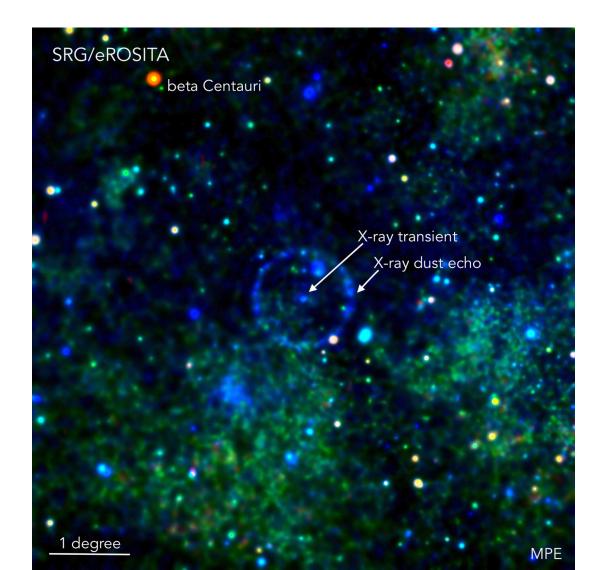


## SRG/eROSITA - the new kid on the block



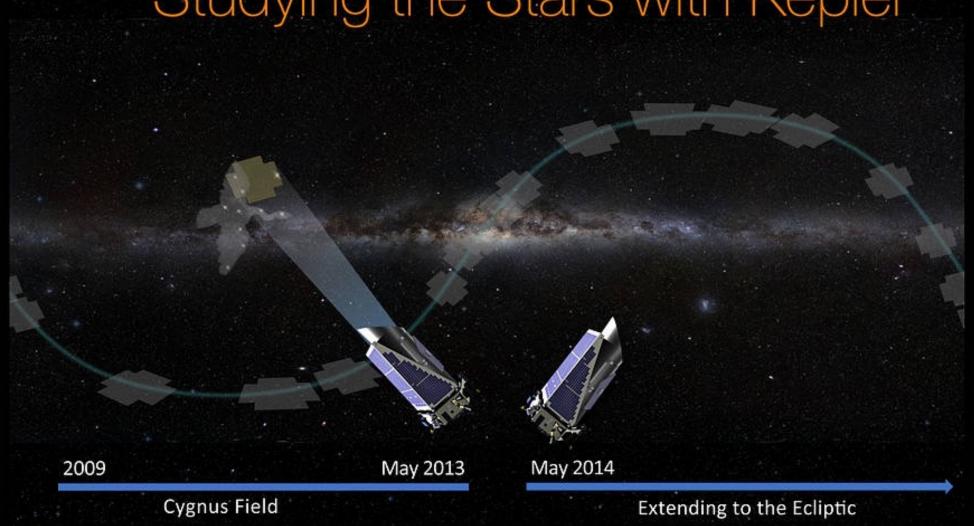
## SRG/eROSITA – all sky & high resolution





# Optical time-series photometry from space

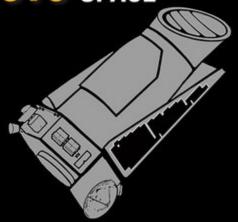
# Studying the Stars with Kepler



### Kepler BY THE NUMBERS



9.6 YEARS IN SPACE



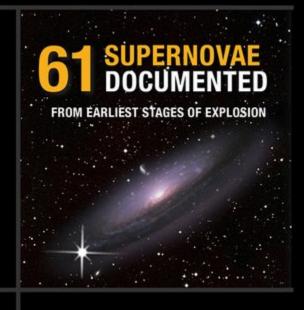
2 MISSIONS COMPLETED

3.12 FUEL USED

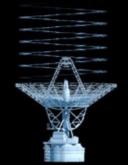




2,662
PLANETS CONFIRMED



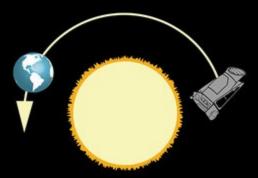
678 # SCIENCE DATA COLLECTED



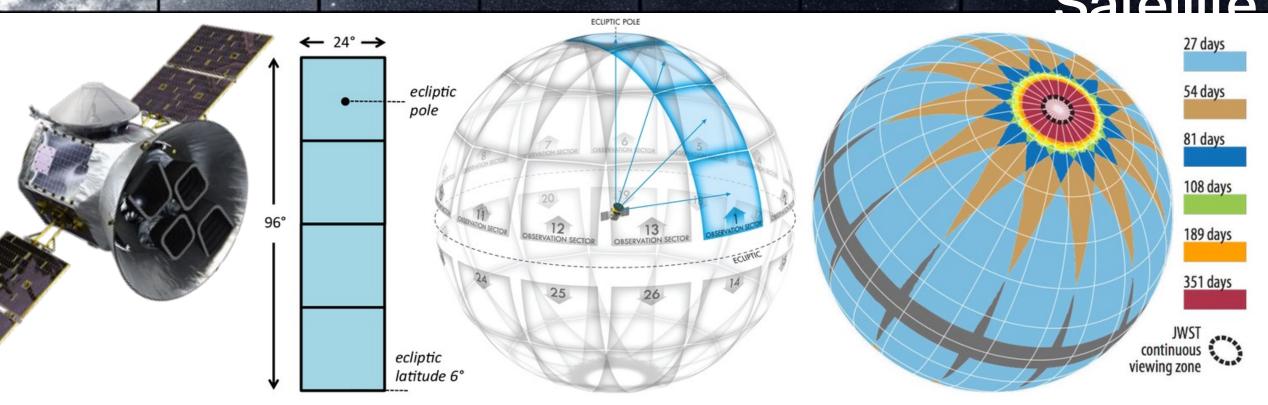
2,946 SCIENTIFIC PAPERS PUBLISHED

732,128
COMMANDS
EXECUTED

94 MILLION MILES AWAY



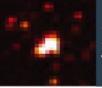
# **TESS – Transiting Exoplanet Survey** Satellite 27 days 54 days ecliptic pole 81 days





#### **Ground Based Follow-Up**

#### **High-Resolution Imaging**



Deep Image of Target Field

High SNR Transit Observation

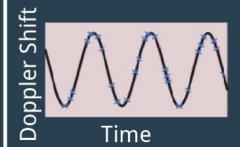


#### **Reconnaissance Spectroscopy**



Improve Stellar Parameters (T<sub>eff</sub>, log g, [m/H])

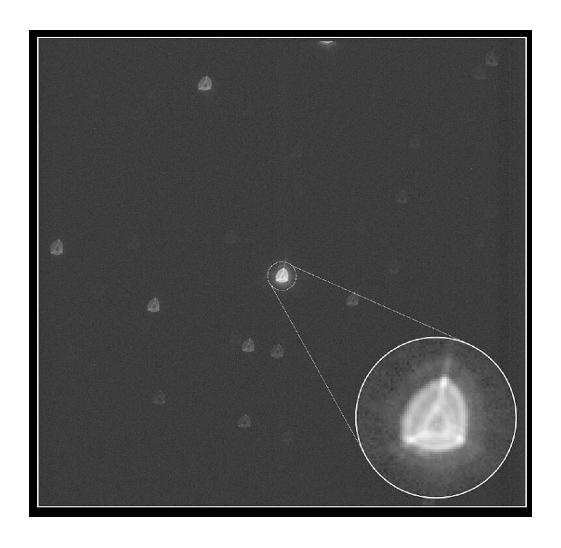
#### **Precise Doppler Spectroscopy**



Planet Mass Measurement

TESS

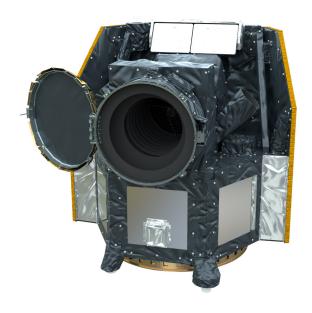
#### **CHEOPS – first Swiss-led ESA Satellite**



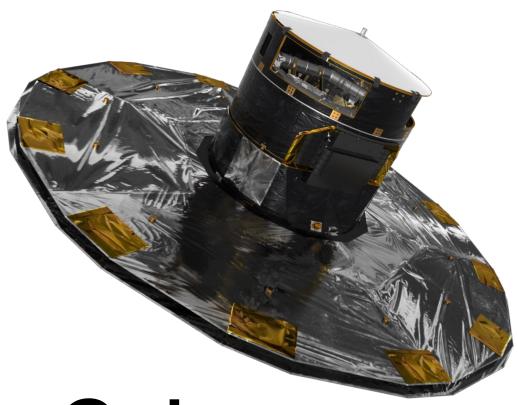




- Strategy:
  - pointed observations
  - Individual target stare down
- Orbit:
  - 700 km elevation
  - Sun-synchronous (dusk/dawn)
  - Typical observation: 48 hours





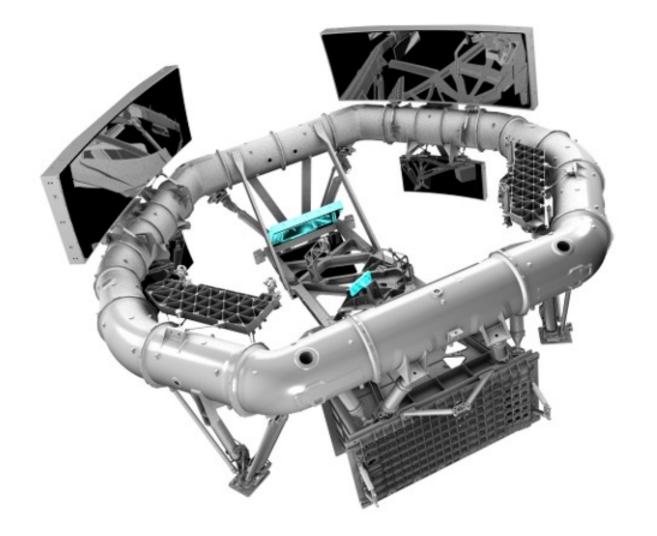


# The ESA mission Gaia

Exploiting positional and electromagnetic variability



# Gaia's Payload Design



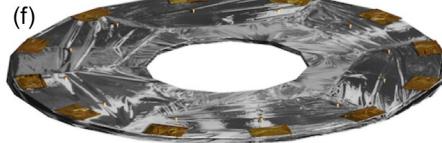


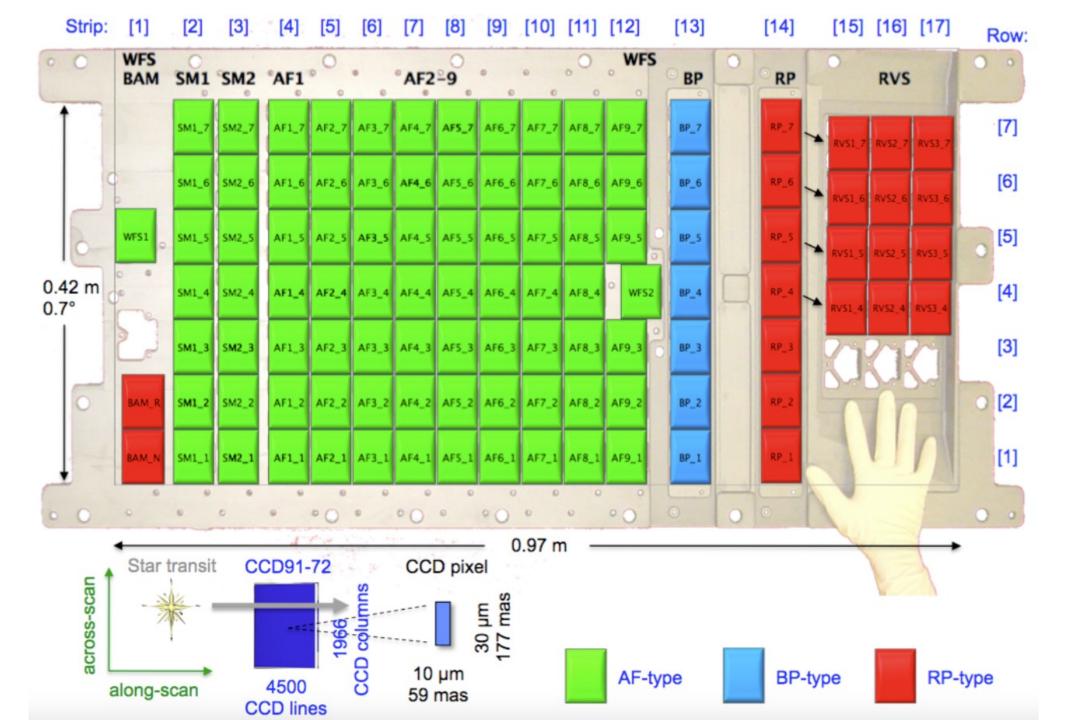


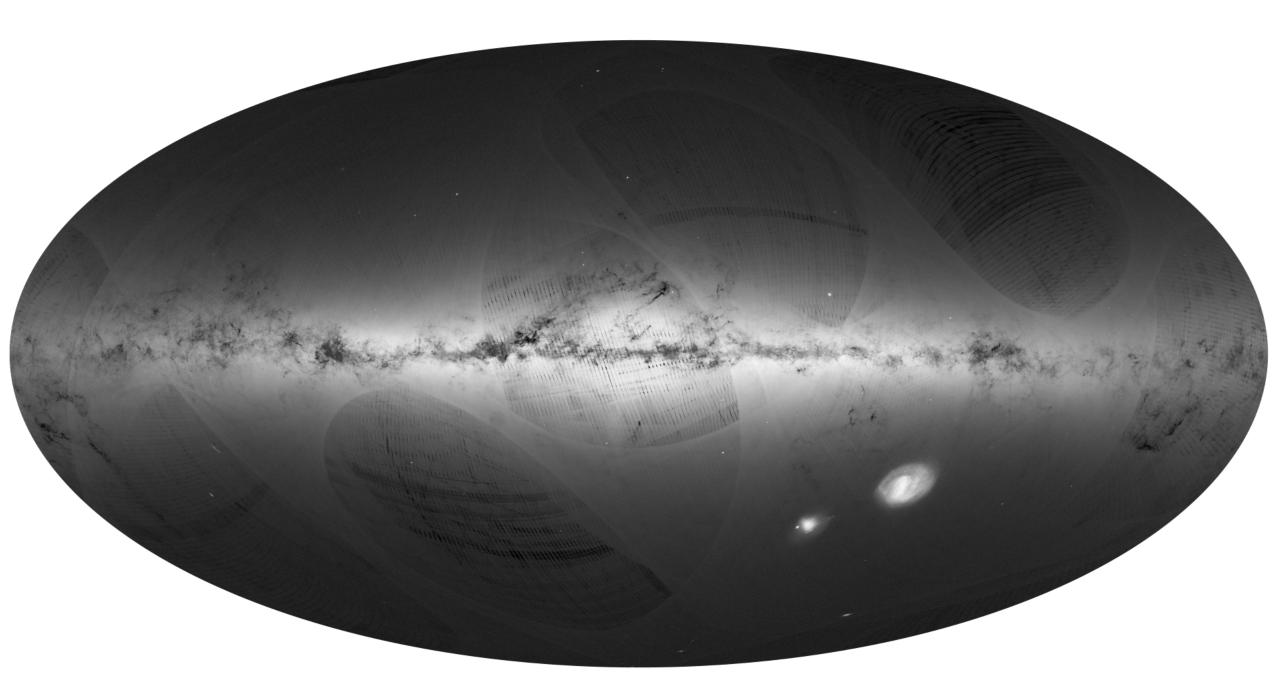






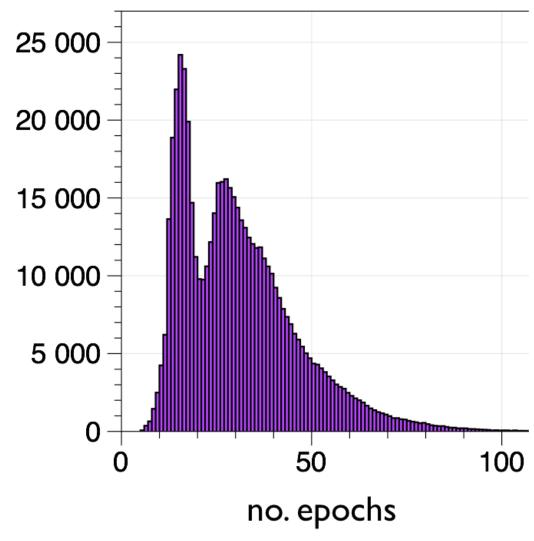


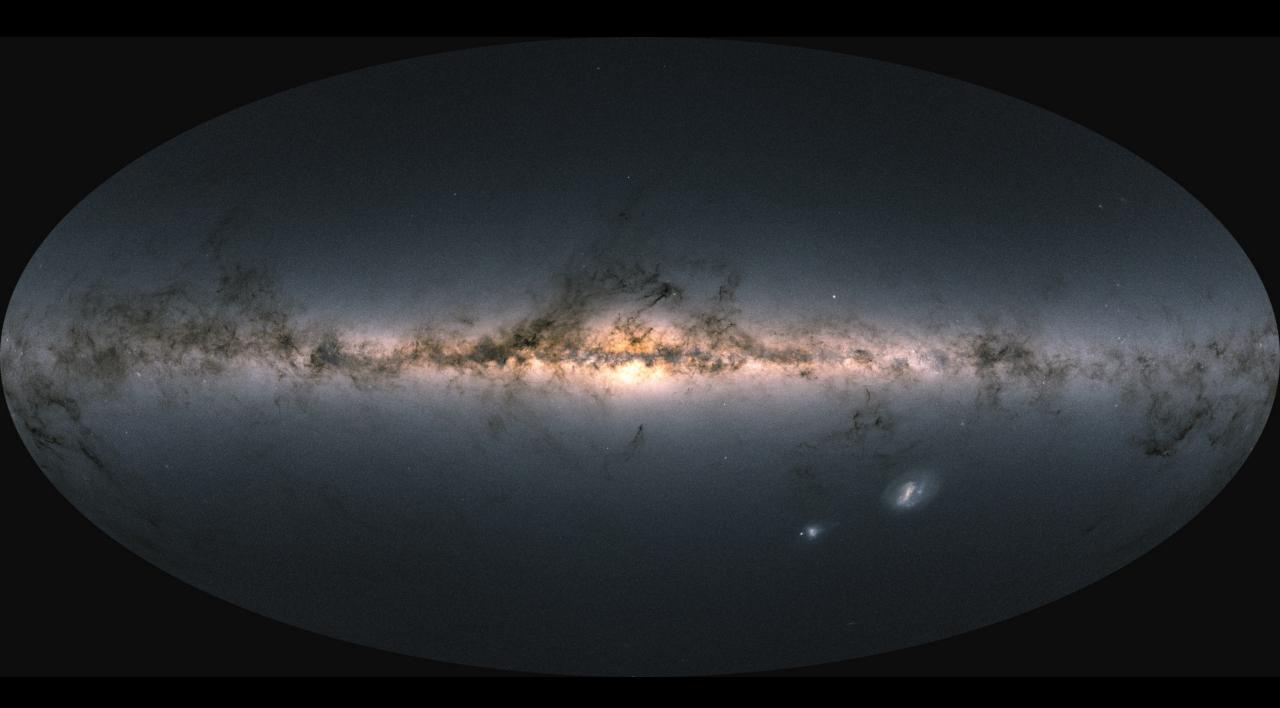




# Light intensity variability in Gaia DR2

- 550 000 variable stars identified (min. 5 transits)
- 3-band light curves for all
- 70% with more than 20 epochs in G
- 360 000 objects classified
- High-amplitude variable stars, short-timescale variables





#### **MILKY WAY STARS**



Data release 3 includes a total of 1.8 billion Milky Way stars – providing astronomers with an unprecedented view of stellar characteristics and their life cycle, and the galaxy's structure

and evolution.

Object classifications

What type of star is it?

Variable stars
10 million

Changing brightness over time Low resolution spectroscopy

470 million astrophysical parameters 220 million spectra

Temperature | Mass Age | Colour Metallicity

Binary star systems

Position | Distance Orbit | Mass

813 thousand

1.8 billion stars

Radial velocity
33 million

Speed star moves towards or away from us

Third velocity dimension

Astrometry and photometry
1.5 billion

Brightness and colour Position | Distance Proper motions

Already released in

High resolution spectroscopy

5.6 million astrophysical parameters

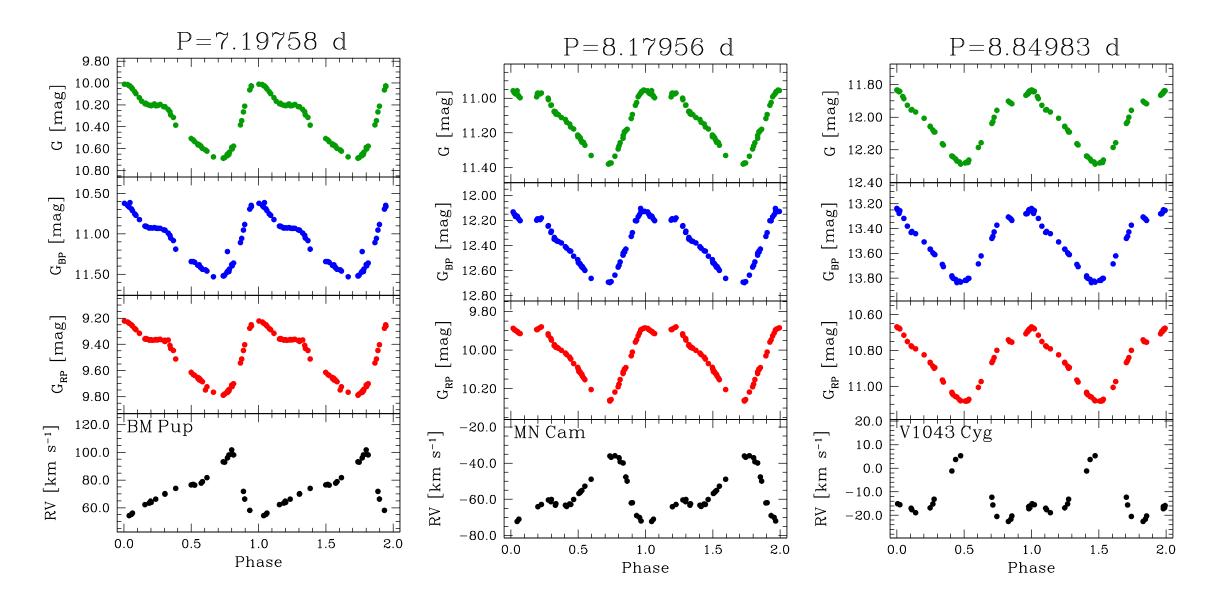
2.5 million chemical compositions

1 million spectra

Chemical composition Temperature | Mass | Age

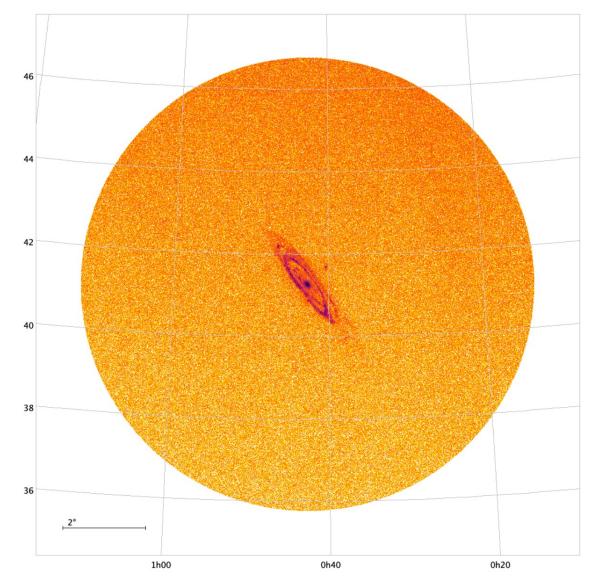


# 3-band & radial velocity time series



# Gaia Andromeda Photometric Survey

- 5.5deg cone centered on M31
- All time series observations available in Gaia DR3
- Preview of what Gaia will deliver in DR4 and 5
- Chromatic light curves of Cepheids at 1 Mpc!

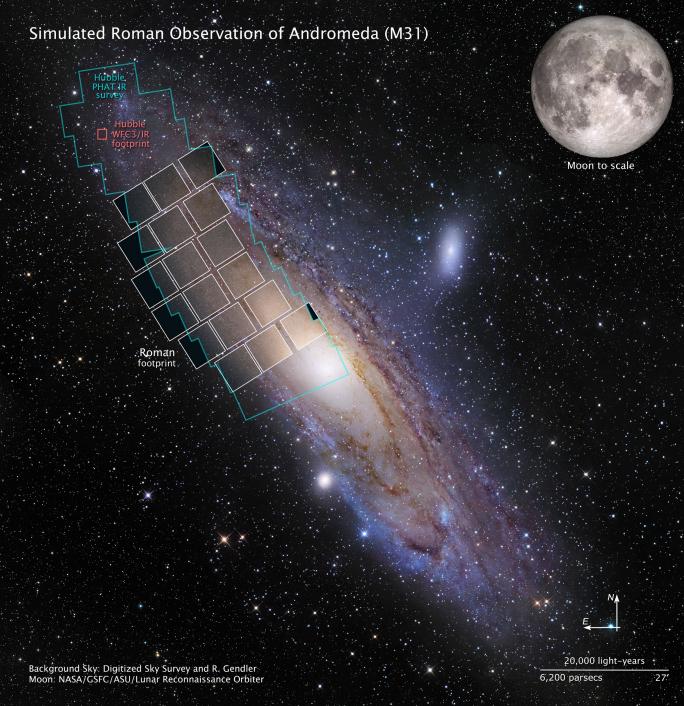


# Nancy Grace Roman Space Telescope (WFIRST)

# Nancy Roman Grace Space Telecope

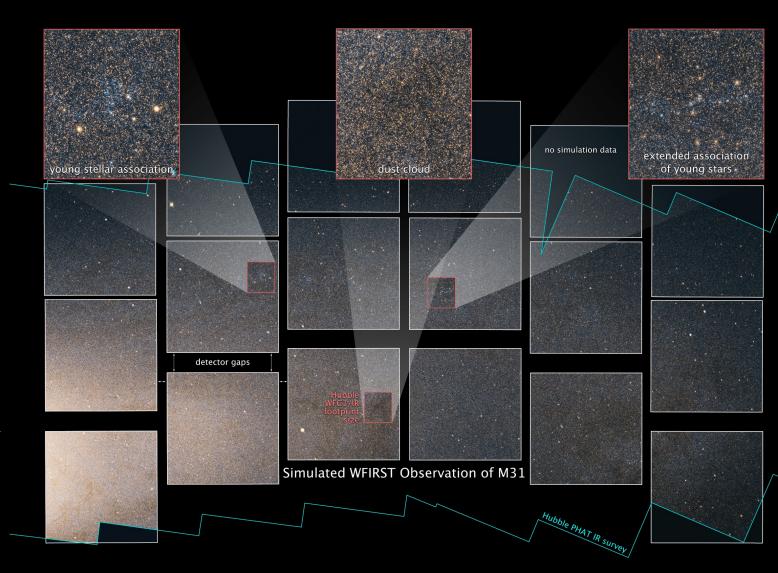
 Decommissioned 2.4m wide-field spy telescope





## **Roman Quick Facts**

- 45' x 23' FoV (0.28sq deg)
- 0.5 2.3 micron
- 0.11"/pix ~ WFC3/IR
- Imaging
- Spectroscopy
- Coronagraphy
- 2/3 core surveys on time-domain: High lat & Galactic bulge



https://roman.gsfc.nasa.gov

# BIG DATA

The Nancy Grace Roman Space Telescope will transmit an unprecedented amount of data from its orbit a million miles away from Earth. Scientists expect it to average almost 1.4 terabytes each day, and after just five years of observations, it should total 20,000 terabytes on MAST, the Mikulski Archive for Space Telescopes. The Hubble Space Telescope sends less than three gigabytes a day, while in the same time even the James Webb Space Telescope will send less than 60 gigabytes.

Hubble

2.7

Webb

58

Roman

1,375

172 terabytes

Hubble's data archive 1990-2020

1,000 terabytes

Webb's data archive after five-year primary mission (projected)

Gaia: 5yr: 3PB 10yr:

6PB?

20,000 terabytes (20 petabytes)

Roman's data archive after five-year primary mission (projected)

Gigabytes per day sent to Earth

# Take aways

- We live in the era of survey astronomy
- Most surveys now have time resolution
- LSST et al. push the full-sky time-resolution multi-band frontier
- Spectroscopic surveys: increasing time-domain applications
- There are Peta-byte scale data avalanches everywhere
- Astrostatistics is a booming field (and a course of its own)
- Check out lecture series: <a href="https://www.samsi.info/astro-time-series-methods-astronomy/">https://www.samsi.info/astro-time-series-methods-astronomy/</a>

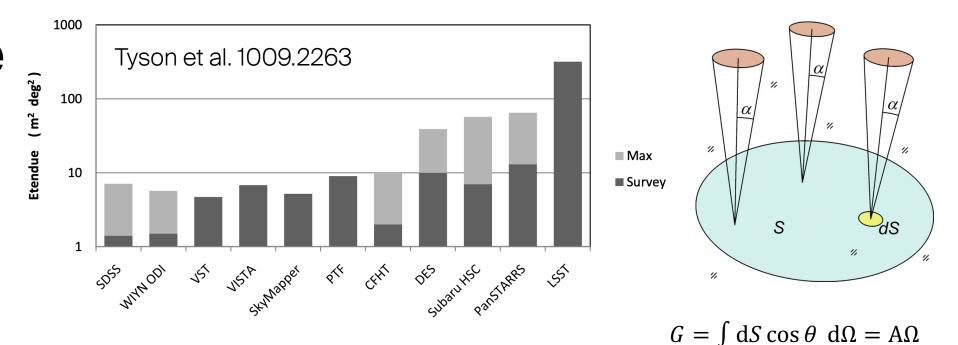
# Quantifying surveys

# Figures of merit – quantifying system performance to achieve science goals

- Cadence, duty cycle & duration
- Sky coverage: location, Field-of-View (FoV), area
- Sky quality
- Depth
- Resolution
- Synergies (e.g. photometry + spectroscopy)
- Tonry 2011, PASP 123, 58
   Bellm 2016, PASP 128, 084501

## **Etendue**

e.g. Tyson et al. 2010



- Etendue = effective area m^2 \* FoV deg^2
- Extensions possible: seeing, QE of detector, etc.
- Combines optical speed (solid angle of pupil) with sensor size
- Rate at which a facility can survey area of sky in single exposure
- Higher etendue = more photons = better S/N!

# Instantaneous volumetric survey speed

Bellm (2016), PASP 128, 084501

$$\dot{V}_M = rac{\Omega_{
m fov}}{4\pi} rac{V_{
m c}(z_{
m lim}(M,t_{
m exp}))}{t_{
m exp}+t_{
m OH}}$$

 $\iota_{\rm exp} + \iota_{\rm OF}$ 

In Euclidean space:

$$\dot{V}_{M} \propto rac{\Omega_{
m fov}}{t_{
m exp} + t_{
m OH}} d^{3}$$

areal survey speed 
$$\dot{\Omega} = \frac{\Omega_{\text{fov}}}{t_{\text{exp}} + t_{\text{OH}}}$$

Instantaneous volumetric survey speed = comoving spatial volume in which object of fiducial abs mag M is detected in single exposure with specified SNR, divided by total time per exposure

 $\Omega_{\text{fov}}$ : camera field of view

 $t_{\mathrm{exp}}$ ,  $t_{\mathrm{OH}}$  : exposure time + overhead

 $z_{
m lim}$ : redshift of object at detection limit

 $V_c(\mathrm{z_{lim}})$  : comoving volume out to  $z_{\mathrm{lim}}$ 

Modern wide-field surveys run out of fresh sky to observe in a given night!

Trade offs depending on survey interests, etc. Figures of merit useful to understand how survey instruments can be built to most effectively deliver desired results!

# XII - Selection functions

### Selection functions

- S is a multiplication of probabilities for a type of object to be seen by the survey
- Critical to understand survey content

$$\lambda_C(y|\theta) = S_C(y) \int p(y|z) \lambda_0(z|\theta) dz = S_C(y) \lambda_0(y|\theta)$$

- Fraction of stars observed:
  - Of all stars in area
  - Of observable stars in area
  - Of observable stars in current footprint (e.g. Gaia ESO: likely members)
- Quantification requires input distribution, but where to get that?
  - Photometry usually available deeper than spectroscopy
- Design (desired cadence) vs actuality (interruptions, etc.)
- Fraction of stars passing quality cuts after observation

 $S_C$ : selection function

y: object properties

z: true quantities

 $\theta$ : model parameters

 $\lambda$ : phys/math model

### Gaia selection function

- Gaia selection function not studied (and difficult to know) ahead of survey
- Roughly 1% of stars in MW (2 billion): what is that representative of?
- Magnitude-limited survey; different instrument have different limits
- All-sky
- Crowded areas can be a problem: blending & data quantity
- Scanning law: completeness can depend on scan direction
- Time-dependent scanning law: not all objects observed on each pass/visit
- Different instruments
- Complex processing steps

## Selection functions

- Usually: unknown
- Frequently: determined post-factum
- Almost always: importance underestimated!
- Ignore it at your own peril
- Arbitrarily complicated: is S constant in time?
- Strauss et al. 1991, PASP 103, 1012
   Mints & Hekker 2018, A&A, 621, A17
   Wojno et al. 2017, MNRAS 468, 3368