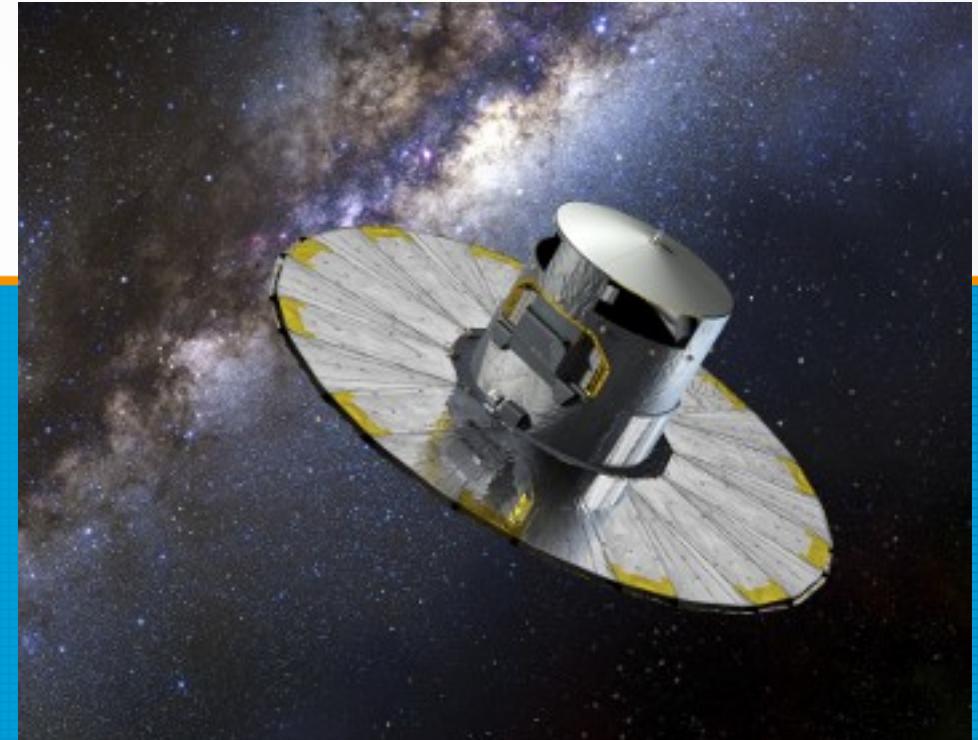


# Exploring the Milky Way: Statistical analysis of Gaia data

**Maria Süveges & Jan Rybizki**  
**MPI for Astronomy (Heidelberg)**  
**Graduate Days of the HGSFP**  
**8 – 12 October 2018**



# Lecture plan – week

- Monday (Jan): Gaia/data overview, first exploration
  - Data access, data cleaning, CMD, nearby stars, MW structure, Hyades cluster
- Tuesday (Maria): Time-series analysis, Gaia epoch photometry
  - Lightcurves from uneven and sparse sampling, variable stars
- Wednesday (Jan): Science case: Stellar encounters
  - RV data, Error sampling, orbit integration, completeness analysis, follow-up
- Thursday (Jan): Bayesian inference: Distances and masses
  - From parallax to distances, stellar parameters from CMD, Priors, MCMC
- Friday (Maria): Classification of variable stars

# Lecture plan - today

- Gaia mission overview
- Gaia DR2 data sets overview
- MW structure / stellar physics (CMD / HRD)
- Data access/exploration, TAP, pyvo, topcat
- Data cleaning: quality indicators, sanity checks
- Nearby stars, volume complete sample
- Hyades, metallicity, age from stellar models

# Prerequisites

- Astronomy background? Python background? PhDs/Master?
- Ask questions! Pair up. Discuss.
- Input slides → Jupyter notebooks (explanations on the fly)
- Maria's part will be more lecture style
- Access course material:
  - jupyter server (<https://jupyter.kip.uni-heidelberg.de>)
  - Data will be online and can be downloaded using the provided scripts
  - At the end everything will be on a github repository

# Gaia Satellite

- Launched on the 19<sup>th</sup> of December 2013
- Nominal end 2019 after 5 years of operations
- Operated by ESA
- The Gaia Data Processing and Analysis Consortium (DPAC) are responsible for processing the raw data, which will be published in Gaia catalogue

# Orbit and data transfer

Lissajous-type orbit around L2

On average: 2mio stars per hour

High density >1mio/deg<sup>2</sup>

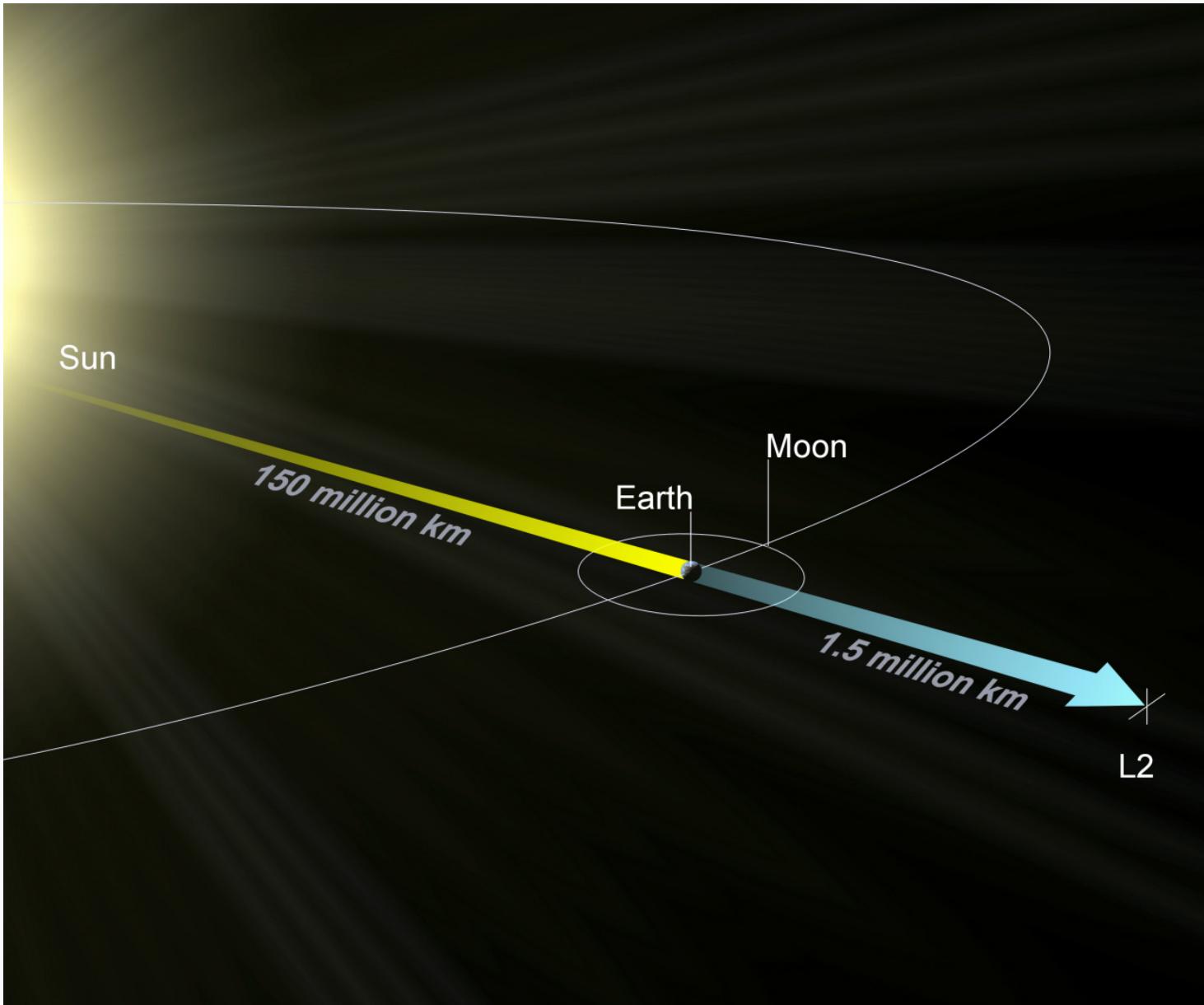
50 GB per day, 8 hours connection

Downlink: up to 7.62 Mbit/s

Spain, Australia, Argentina

35 m radio telescopes,

X- band (7145-8500 MHz)

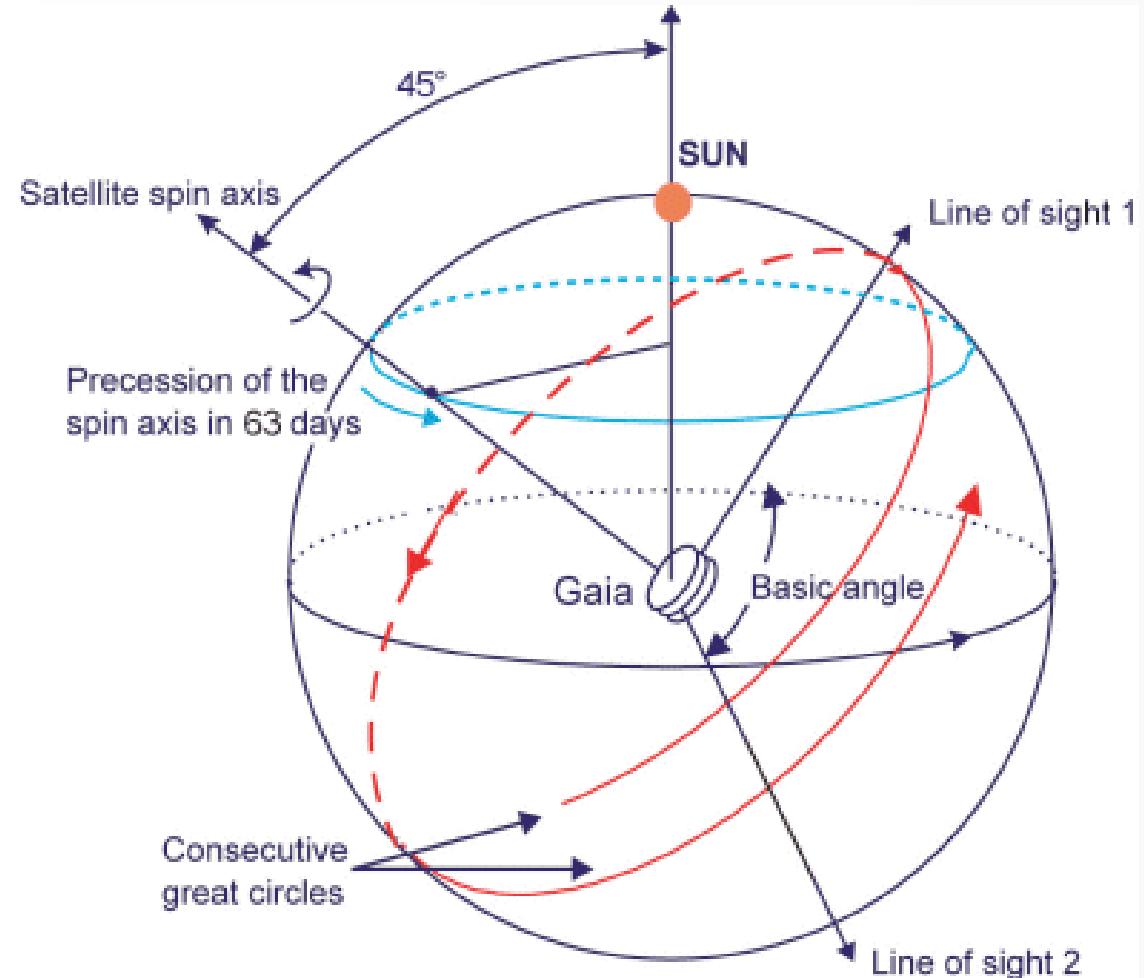


# Scanning law

Rotation  $1^\circ$  per minute  
→ 6 hours full circle

Unequal sampling of sources across the sky  
→ Marias lecture (animation) tomorrow

On average each source will be visited 70 times  
Some more than 250 times others less than 30



Credit: ESA

# Telescope

Basic angle is  $106.5^\circ$

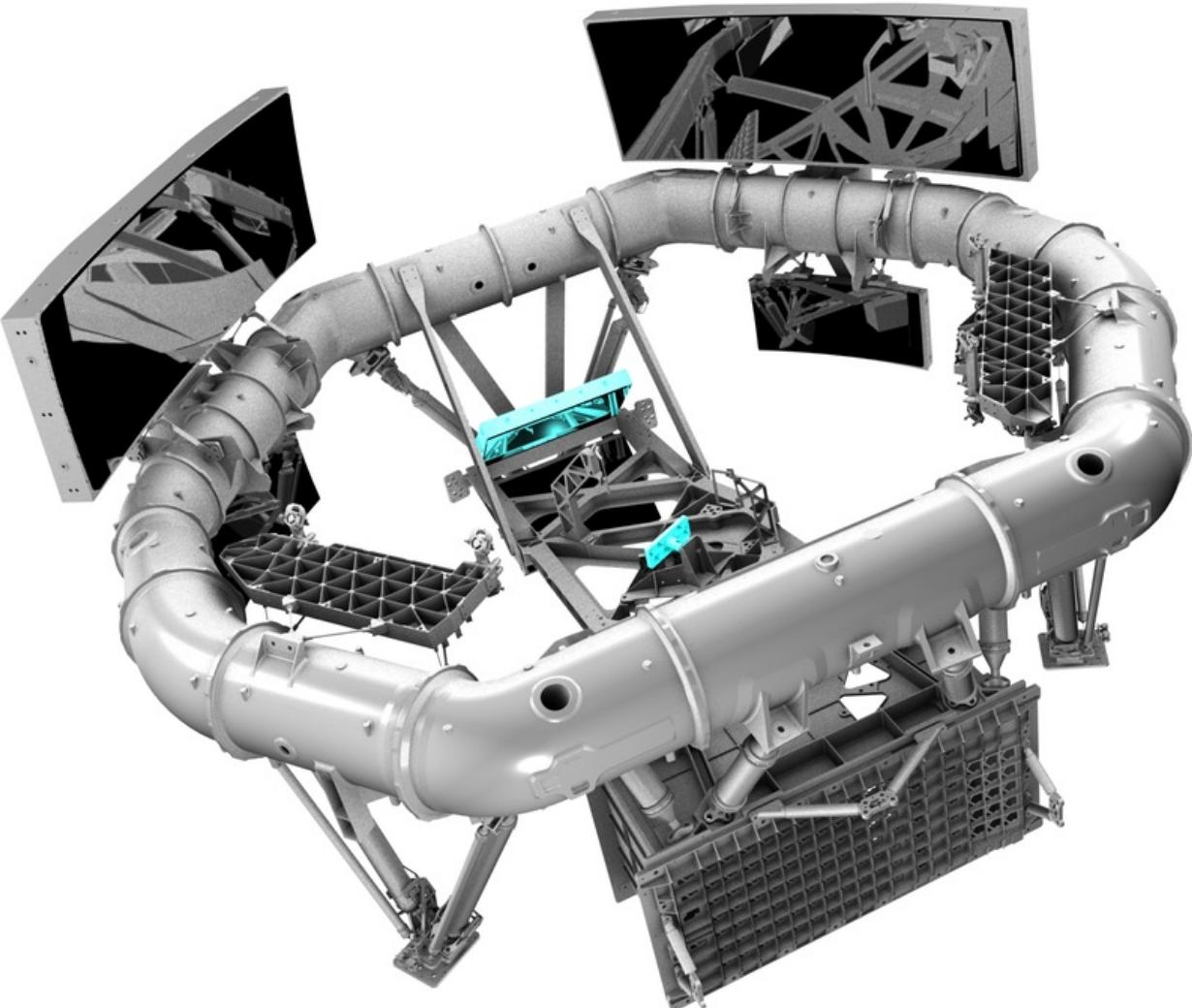
→ most sources will be visited  
with  $106.5$  minutes separation  
and some also at  $360$  after first  
detection

Focal length:  $35m$

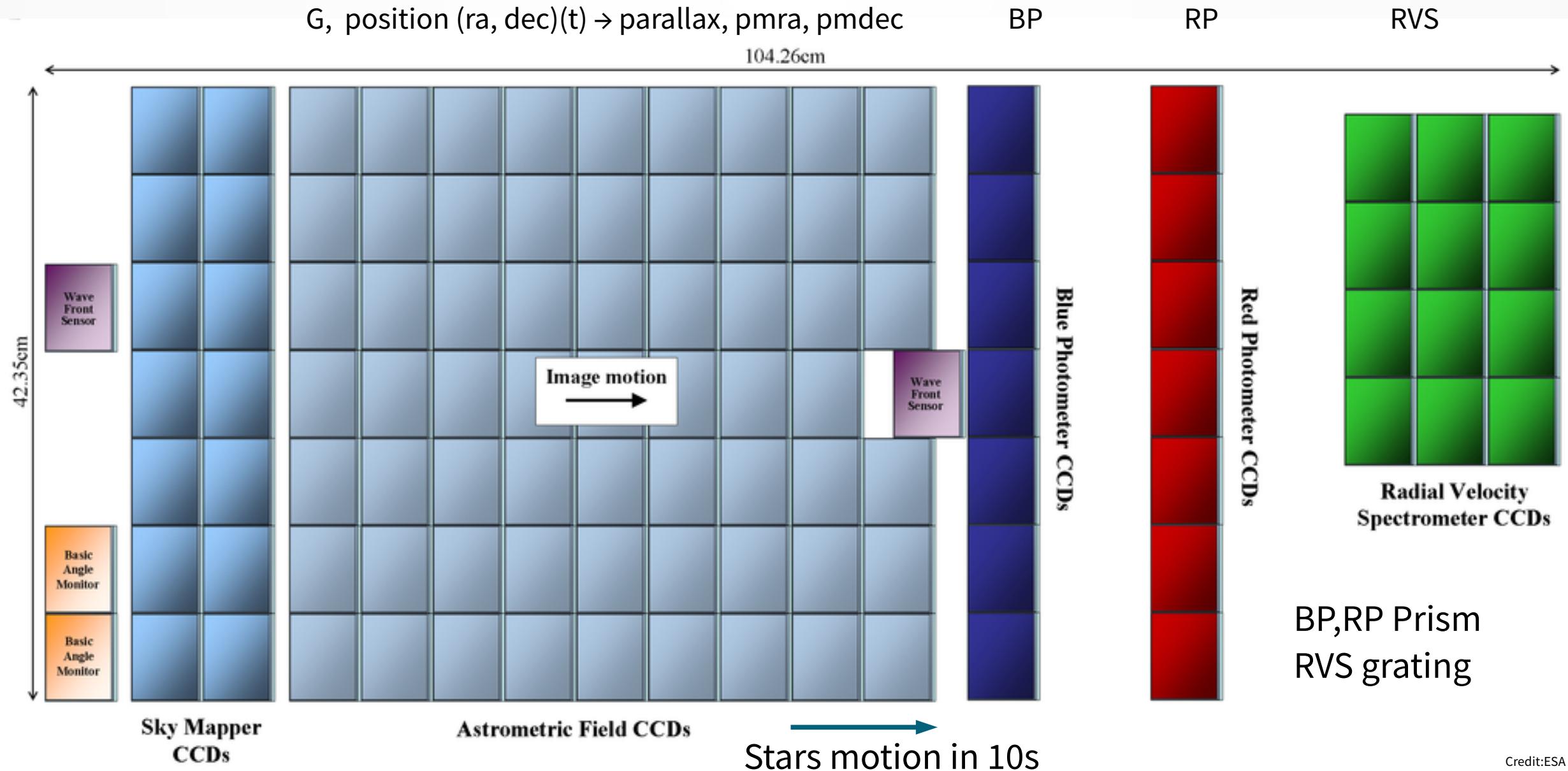
Aperture:  $1.45m \times 0.5m$

Field of view:  $1.7^\circ \times 0.6^\circ$

6mirrors, 4 is combiner



# Focal plane



# Focal plane

- TDI (time delay integration  $\sim 1\text{ms}$ ) = pixel crossing time
- Bright stars TDI gates activated, shorten the integration time
- Along scan  $4500 \times 10\mu\text{m}$ , across scan  $1966 \times 30\mu\text{m}$
- Operational temperature =  $-115^\circ\text{C}$
- 106 CCDs, almost 1 Gpixel

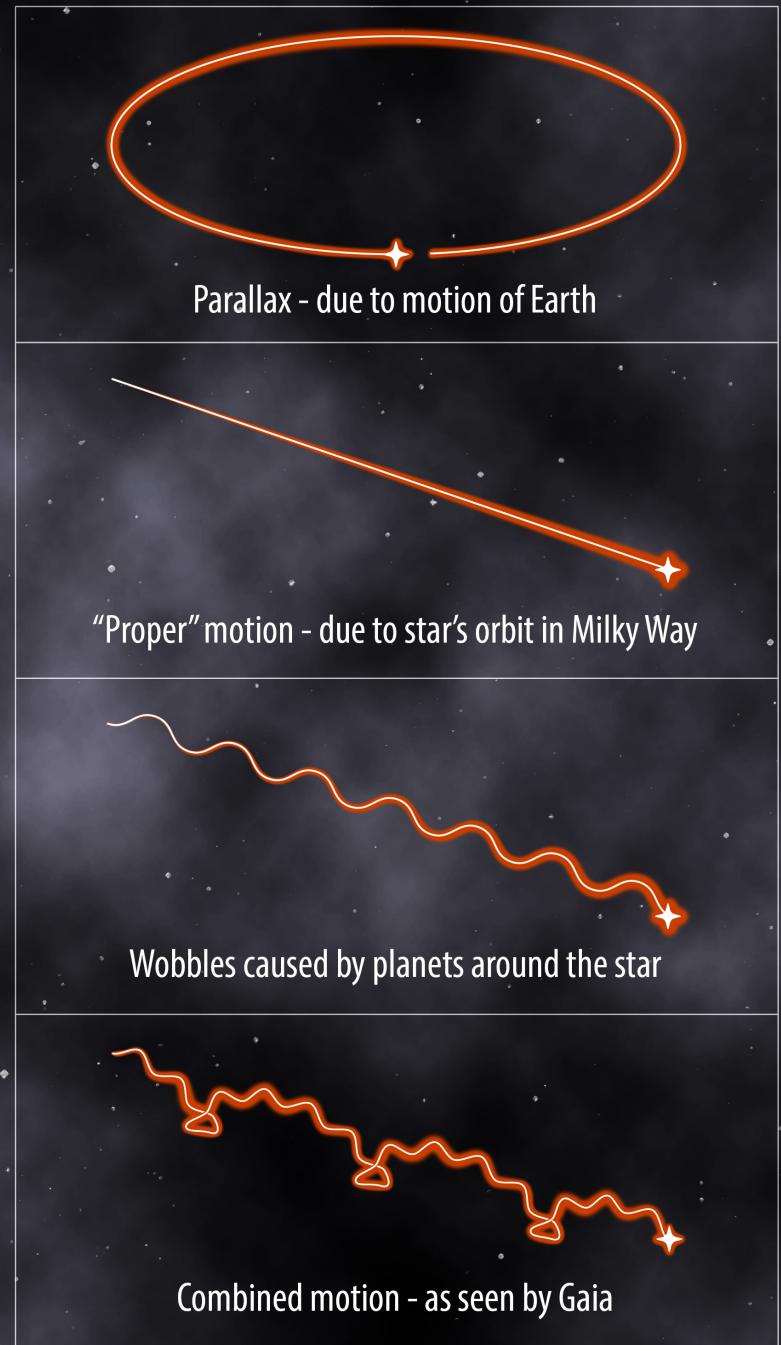
# Measurements

- Astrometry (today)
  - Position (ra, dec), parallax, proper motion (pmra, pmdec)
- Photometry (today)
  - G, G\_BP, G\_RP (also needed for chromaticity calibration)
  - continuous spectra (120 pixel) in the band 330-1050 nm (not part of DR2)
- Spectrometry (Wednesday)
  - high resolution, grating, narrow band: 845-872 nm, (only RVs published)
- Epoch data for all of these (Tuesday)

# Astrometry

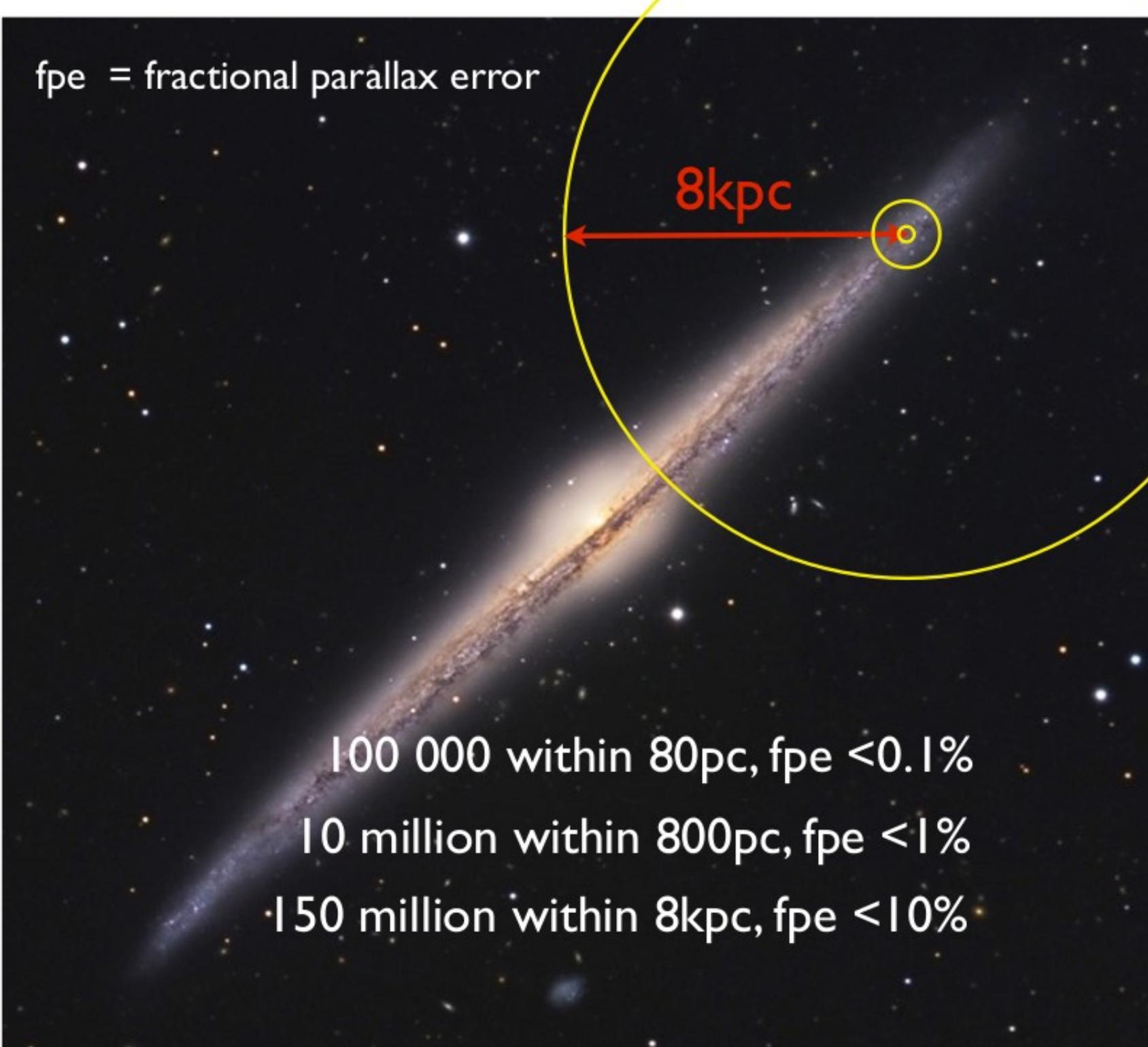
- 1 arcsec (as)  $\rightarrow$  1 parsec (pc)
  - 30 arcmin  $\sim$  moon or sun diameter
  - 1 arcmin  $\sim$  eye's resolution
  - 1 as  $\sim$  human hair diameter in 10m
  - 20  $\mu$ as  $\sim$  Gaia uncertainty (50 kpc)
- Proxima Centauri 1.3 pc  $\rightarrow$  0.77 as
- Bernard's Star has pm 10.3 as/yr
- Parallax uncertainty dependent on G and N\_obs

Apparent motion of a star seen from Earth



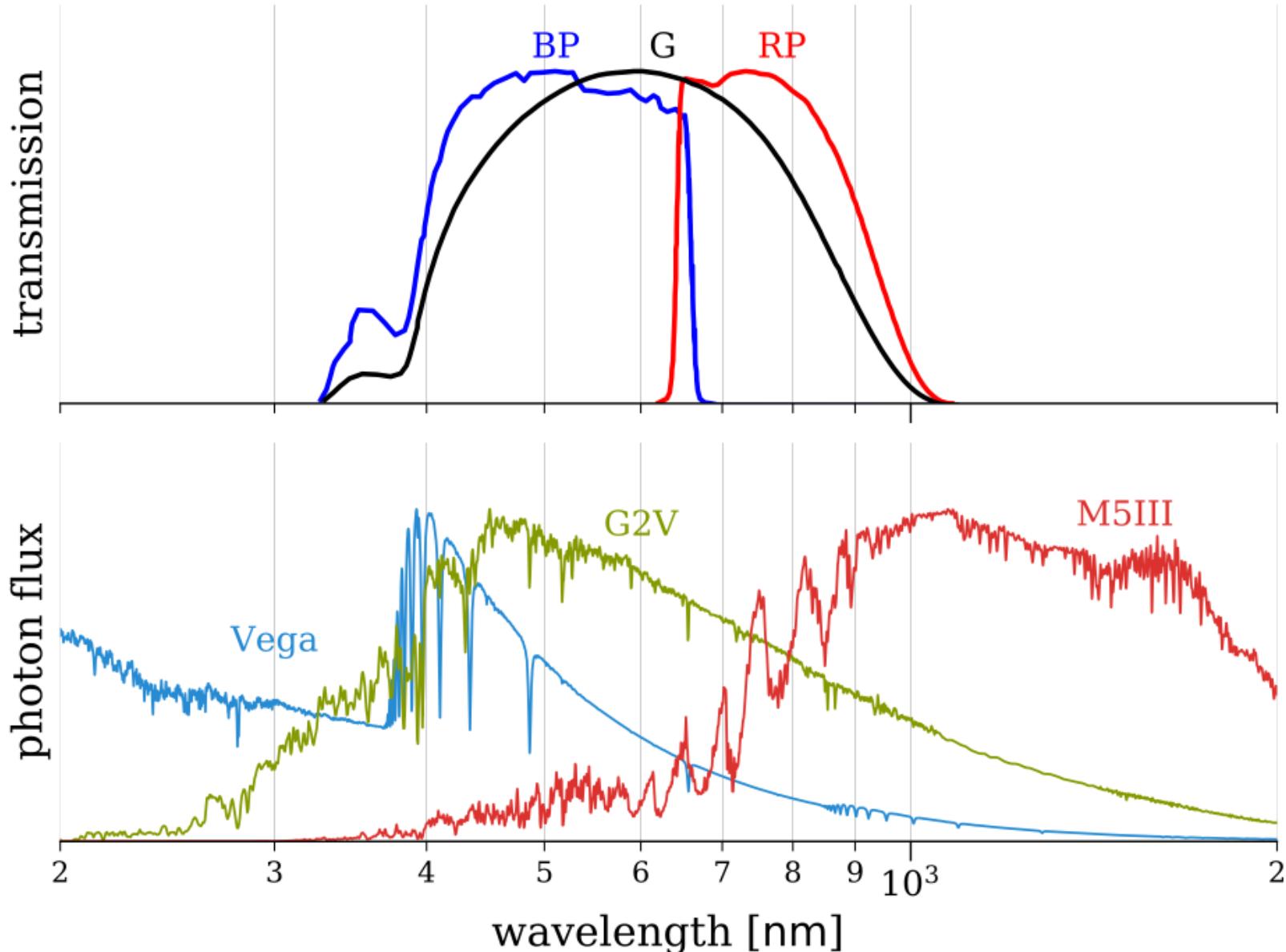
# Parallax

Distance Measurement



# Photometry

- Flux from different photometric bands
- G, BP, RP
- Given in Magnitudes
- Vega 9,600 °K
- G2V (Sun) 5,800 °K
- M5III 3,000 °K



# Photometry

- Apparent magnitude ( $m = 2.5 \times \log_{10}(F(d))$ )

- Sun -27
- Moon -13
- Rigel 0
- Pluto 14

Visible to typical human eye <sup>[1]</sup>	Apparent magnitude	Bright-ness relative to Vega	Number of stars brighter than apparent magnitude <sup>[2]</sup> in the night sky
Yes	-1.0	250%	1 ( <a href="#">Sirius</a> )
	0.0	100%	4
	1.0	40%	15
	2.0	16%	48
	3.0	6.3%	171
	4.0	2.5%	513
	5.0	1.0%	1602
	6.0	0.4%	4800
	6.5	0.25%	9100 <sup>[3]</sup>
No	7.0	0.16%	14 000
	8.0	0.063%	42 000
	9.0	0.025%	121 000
	10.0	0.010%	340 000

# Photometry

- Apparent magnitude ( $m = 2.5 \times \log_{10}(F(d))$ )

  - Sun -27
  - Moon -13
  - Rigel 0
  - Pluto 14

- Absolute magnitude ( $M = 2.5 \times \log_{10}(F(10\text{pc}))$ )

  - Range for stars is  $\sim -10$  to  $+17$
  - Rigel -8
  - Vega 0.5
  - Sun 5
  - Proxima Centauri 16

Visible to typical human eye <sup>[1]</sup>	Apparent magnitude	Bright-ness relative to Vega	Number of stars brighter than apparent magnitude <sup>[2]</sup> in the night sky
Yes	-1.0	250%	1 ( <a href="#">Sirius</a> )
	0.0	100%	4
	1.0	40%	15
	2.0	16%	48
	3.0	6.3%	171
	4.0	2.5%	513
	5.0	1.0%	1602
	6.0	0.4%	4800
	6.5	0.25%	9100 <sup>[3]</sup>
No	7.0	0.16%	14 000
	8.0	0.063%	42 000
	9.0	0.025%	121 000
	10.0	0.010%	340 000

# Photometry

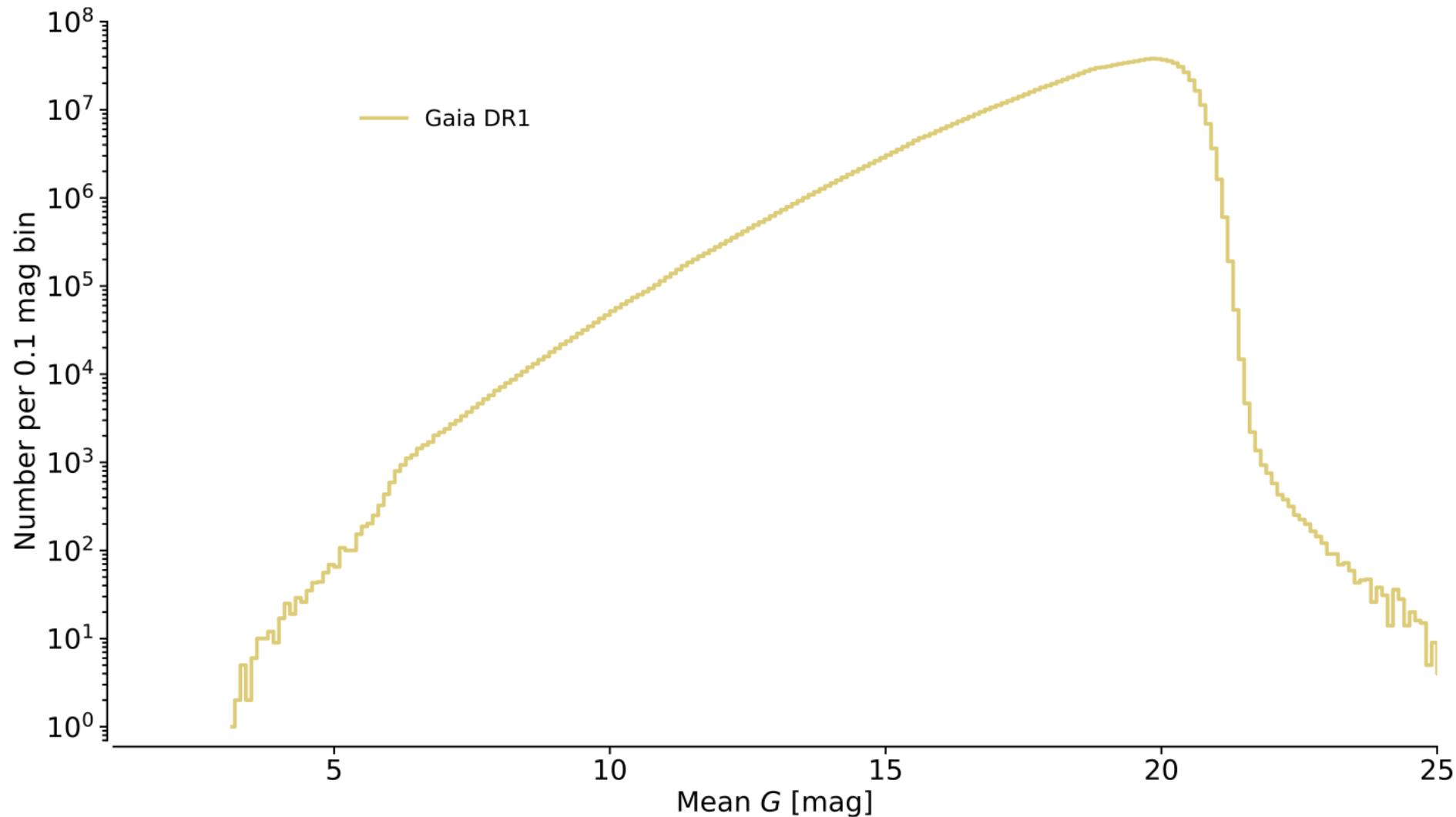
- Apparent magnitude ( $m = 2.5 \times \log_{10}(F(d))$ )
  - Sun -27
  - Moon -13
  - Rigel 0
  - Pluto 14
- Absolute magnitude ( $M = 2.5 \times \log_{10}(F(10\text{pc}))$ )
  - Range for stars is  $\sim -10$  to  $+17$
  - Rigel -8
  - Vega 0.5
  - Sun 5
  - Proxima Centauri 16
- Inverse square law:  $2 \times \text{distance} \rightarrow \frac{1}{4} \times \text{brightness}$ 
  - Distance modulus:  $\mu = m - M = 5 \times \log_{10}(d) - 5$
  - Sun in 100pc distance would be 10 mag (100 times fainter)
  - Sun in 1000pc distance would be 15 mag (10,000 times fainter)

Visible to typical human eye <sup>[1]</sup>	Apparent magnitude	Brightness relative to Vega	Number of stars brighter than apparent magnitude <sup>[2]</sup> in the night sky
Yes	-1.0	250%	1 ( <a href="#">Sirius</a> )
	0.0	100%	4
	1.0	40%	15
	2.0	16%	48
	3.0	6.3%	171
	4.0	2.5%	513
	5.0	1.0%	1602
	6.0	0.4%	4800
	6.5	0.25%	9100 <sup>[3]</sup>
No	7.0	0.16%	14 000
	8.0	0.063%	42 000
	9.0	0.025%	121 000
	10.0	0.010%	340 000

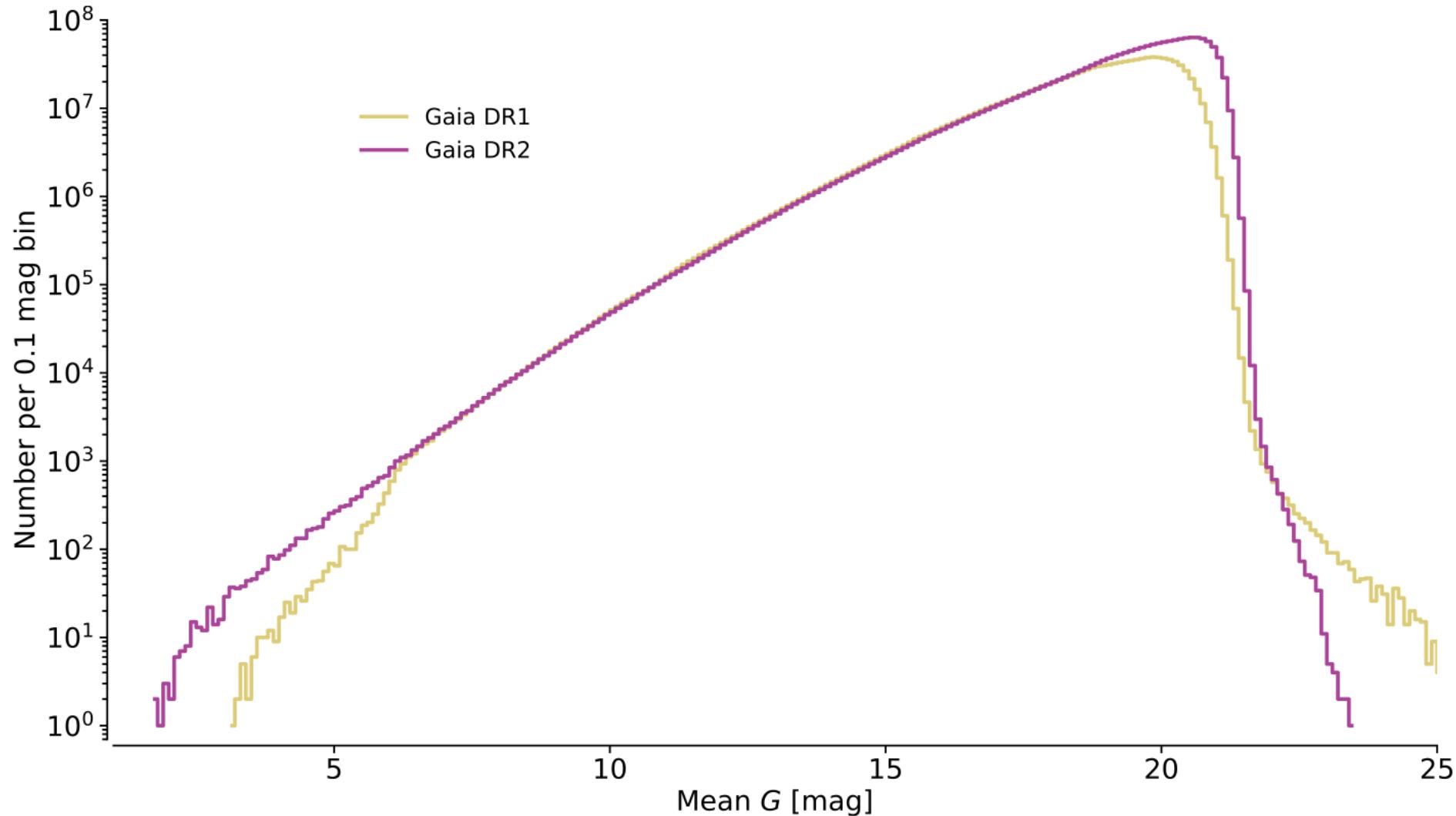
Data product	Gaia DR2	Gaia DR1
Total number of sources	1.69 billion	1.14 billion
Position, parallax, proper motion	1.33 billion	0.002 billion
Position only	0.36 billion	1.14 billion
Mean $G$	1.69 billion	1.14 billion
Mean $G_{\text{BP}}$ , $G_{\text{RP}}$	1.38 billion	-
Median $v_{\text{rad}}$ at $G_{\text{RVS}} < 12$ ( $G \lesssim 13$ )	7.2 million	-
Astrophysical parameters at $G < 17$	77–161 million	-
Variable star light curves	551 thousand	3 thousand
Epoch astrometry/photometry for a pre-selected list of asteroids	14 thousand	-

Exact numbers and more info: <https://www.cosmos.esa.int/web/gaia/dr2>

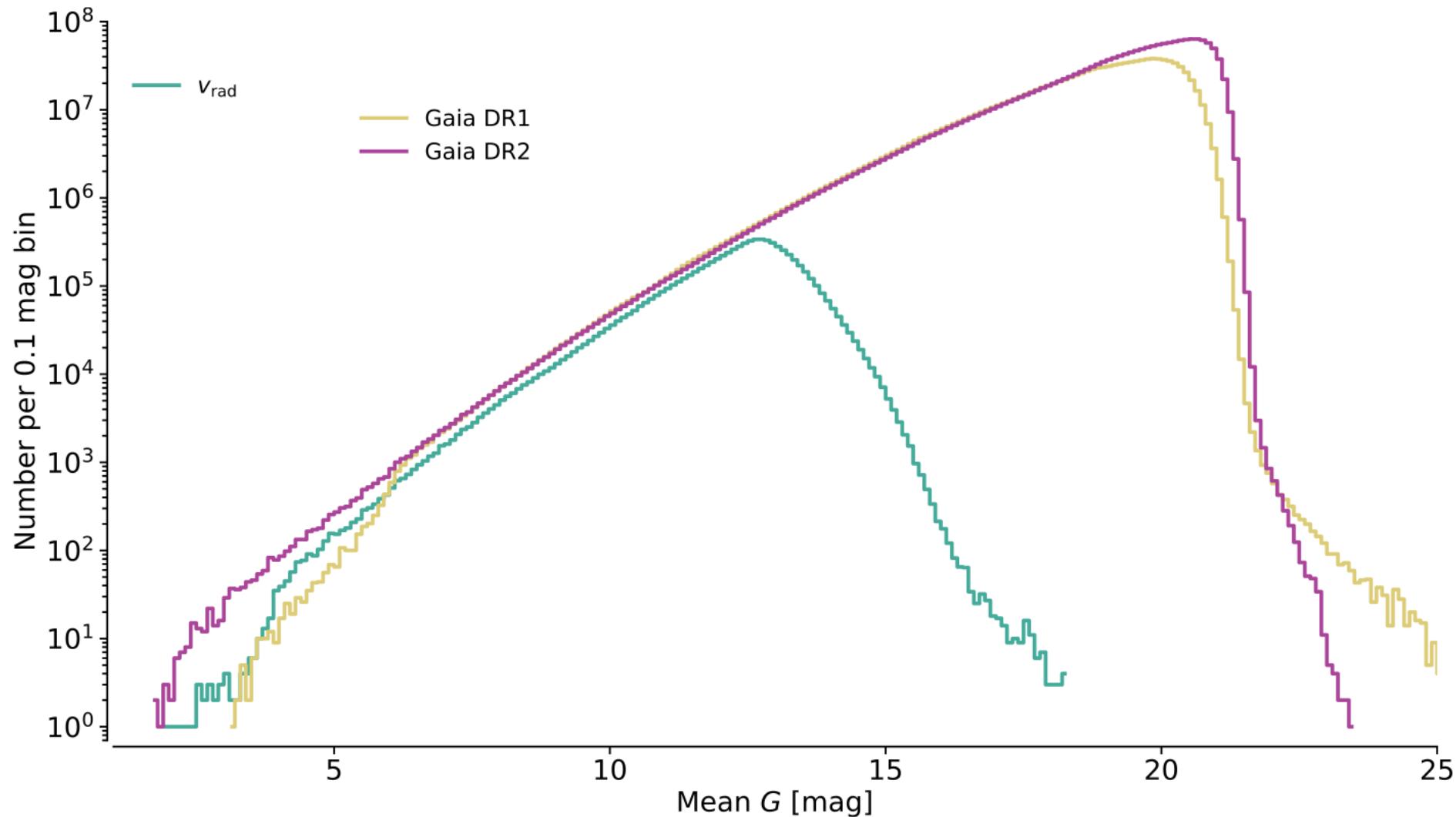
# Magnitude distributions



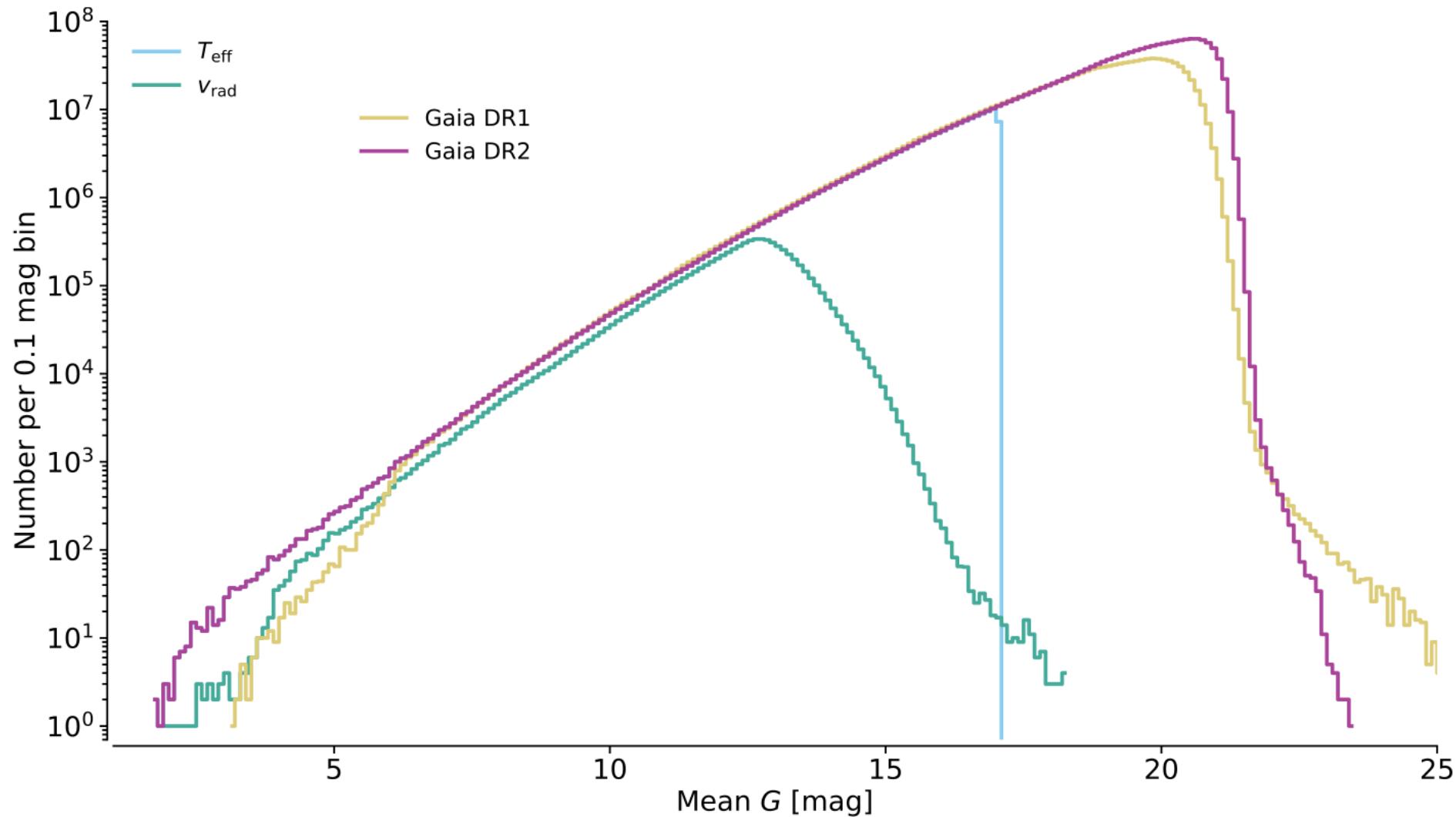
# Magnitude distributions



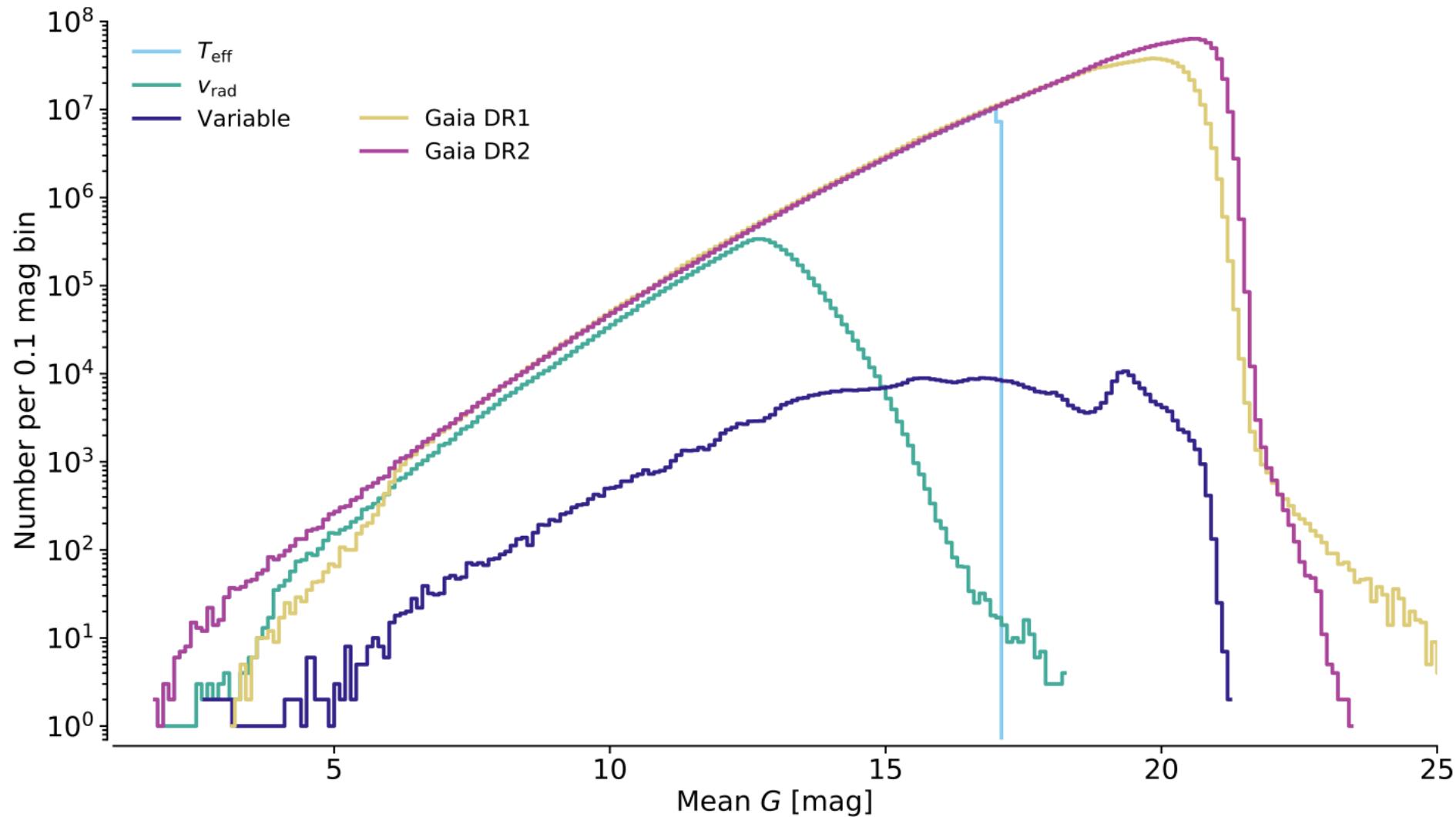
# Magnitude distributions



# Magnitude distributions



# Magnitude distributions

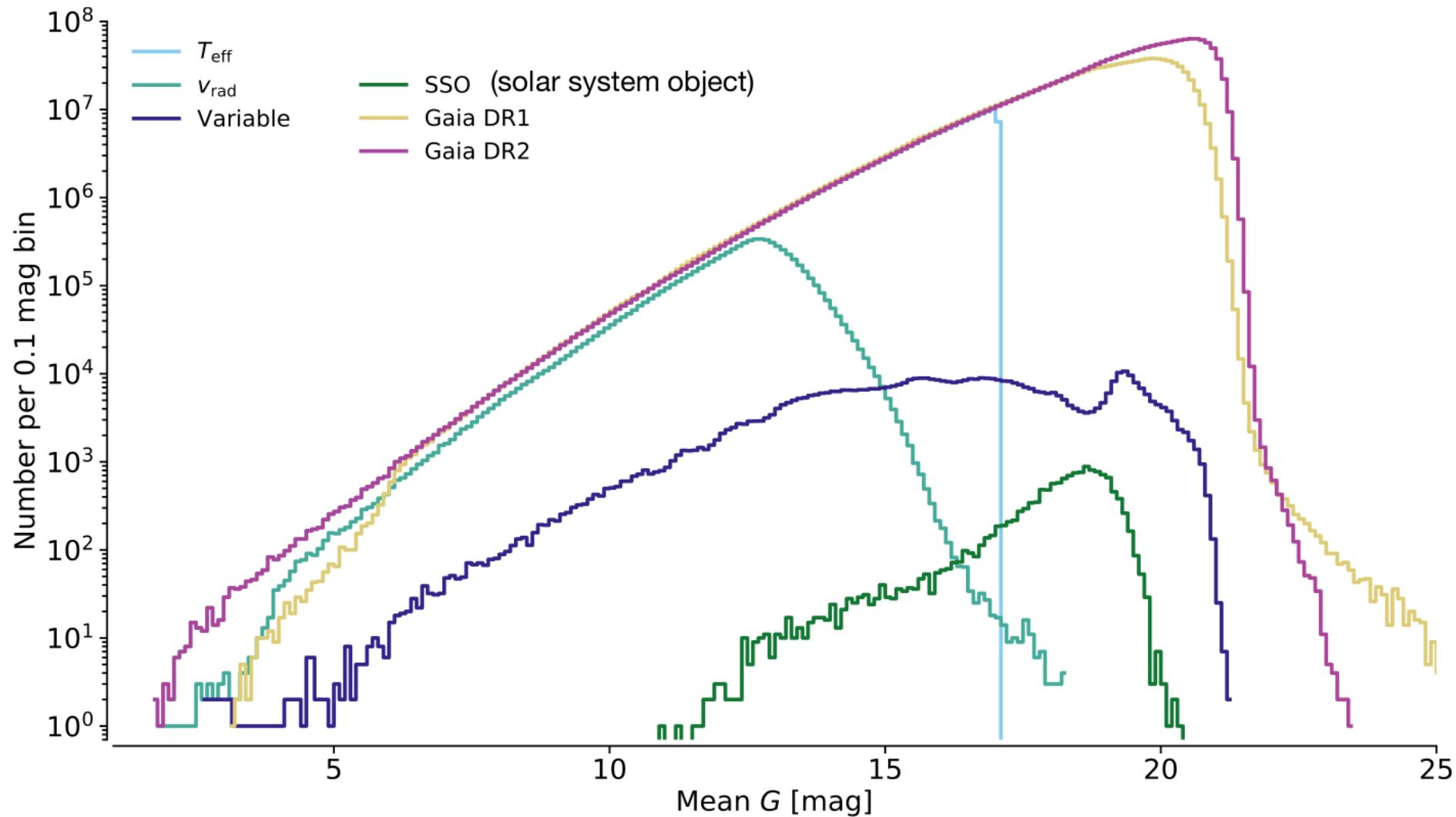


# Magnitude distributions



gaia

Gaia  
DPAC

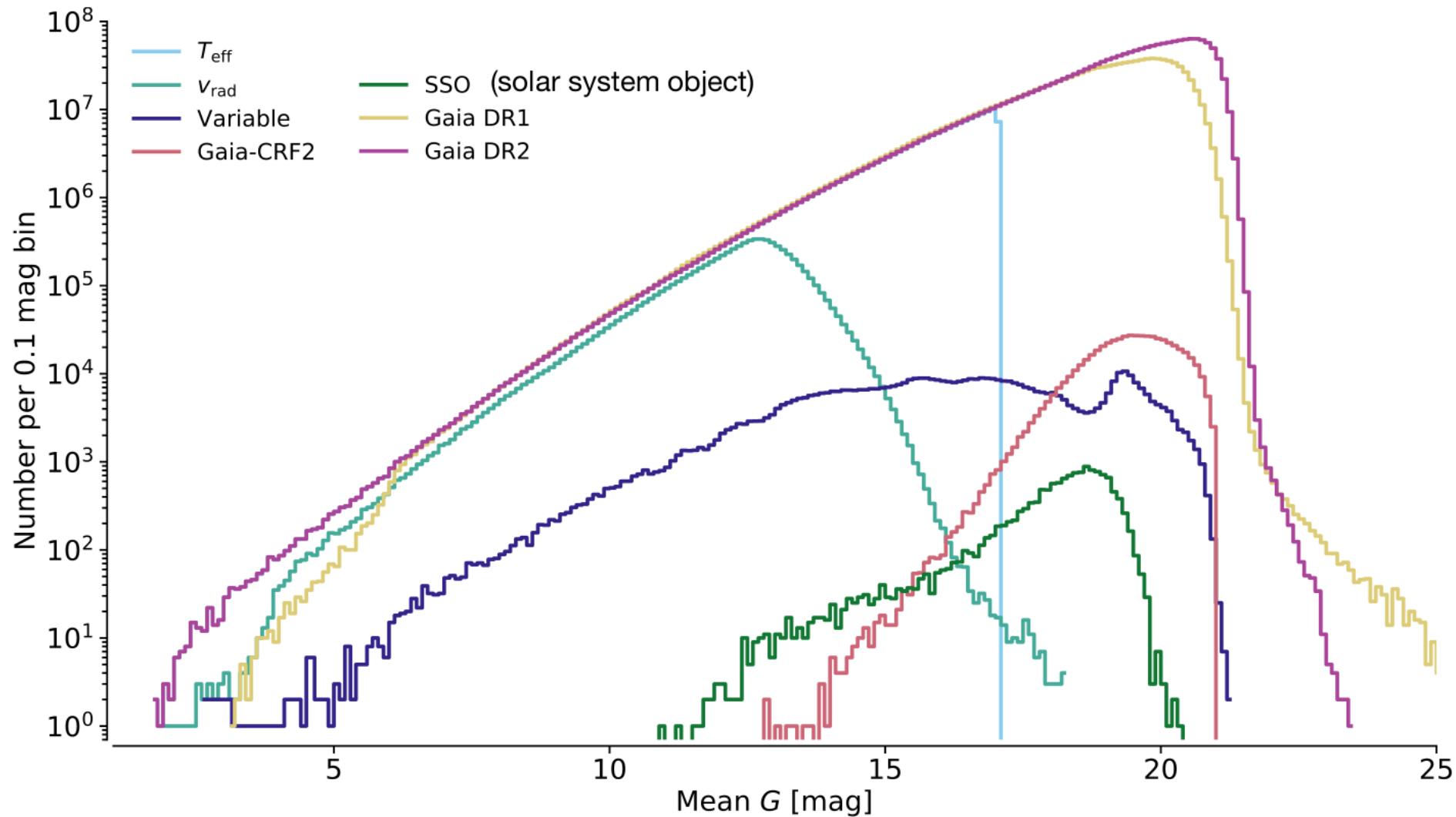


# Magnitude distributions

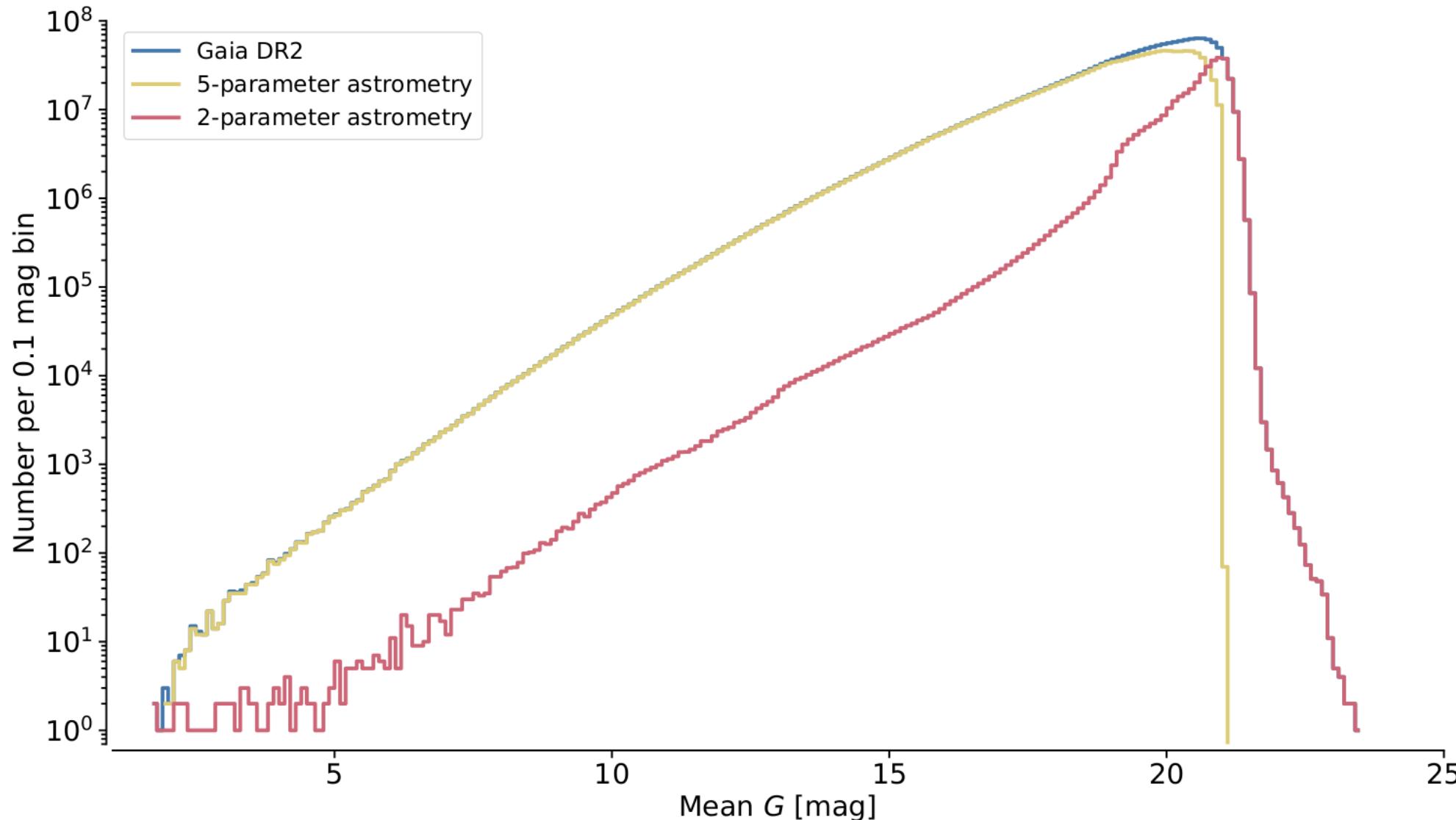


gaia

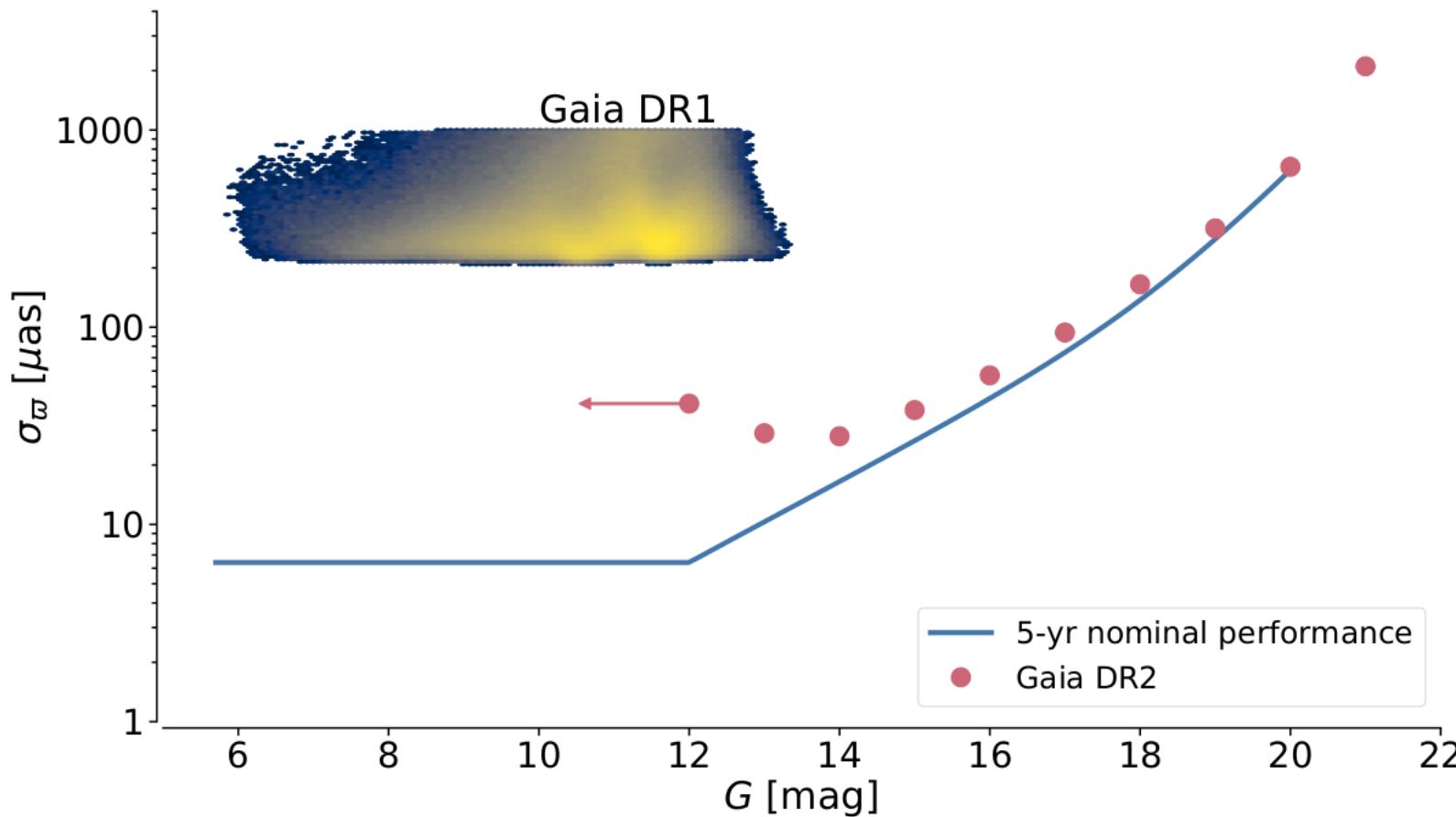
Gaia  
DPAC



# Source counts



# Astrometric performance Gaia DR2

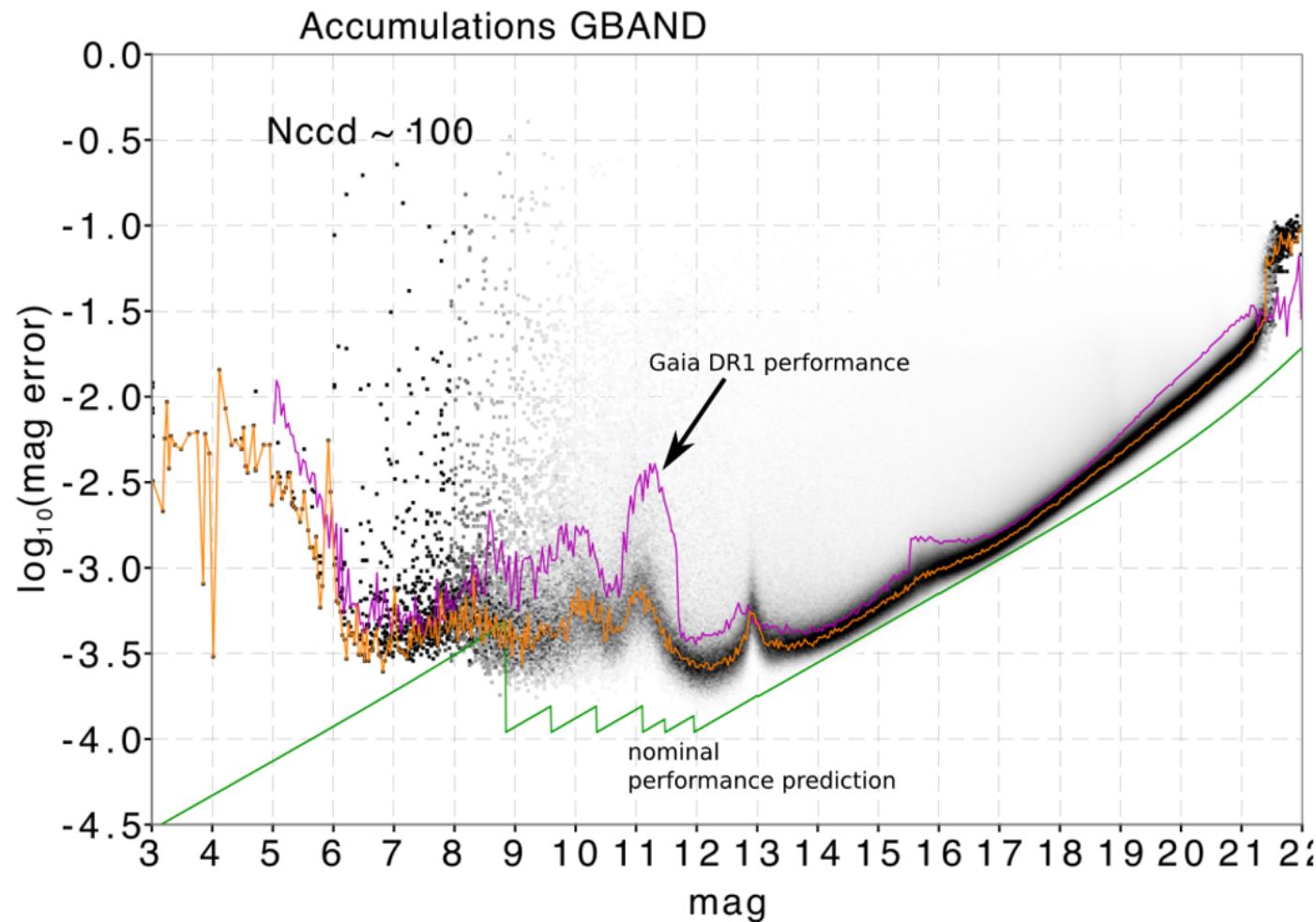


Typical parallax precision

$G = 15$	0.02–0.04 mas
$G = 17$	0.1 mas
$G = 20$	0.7 mas
$G = 21$	2.0 mas

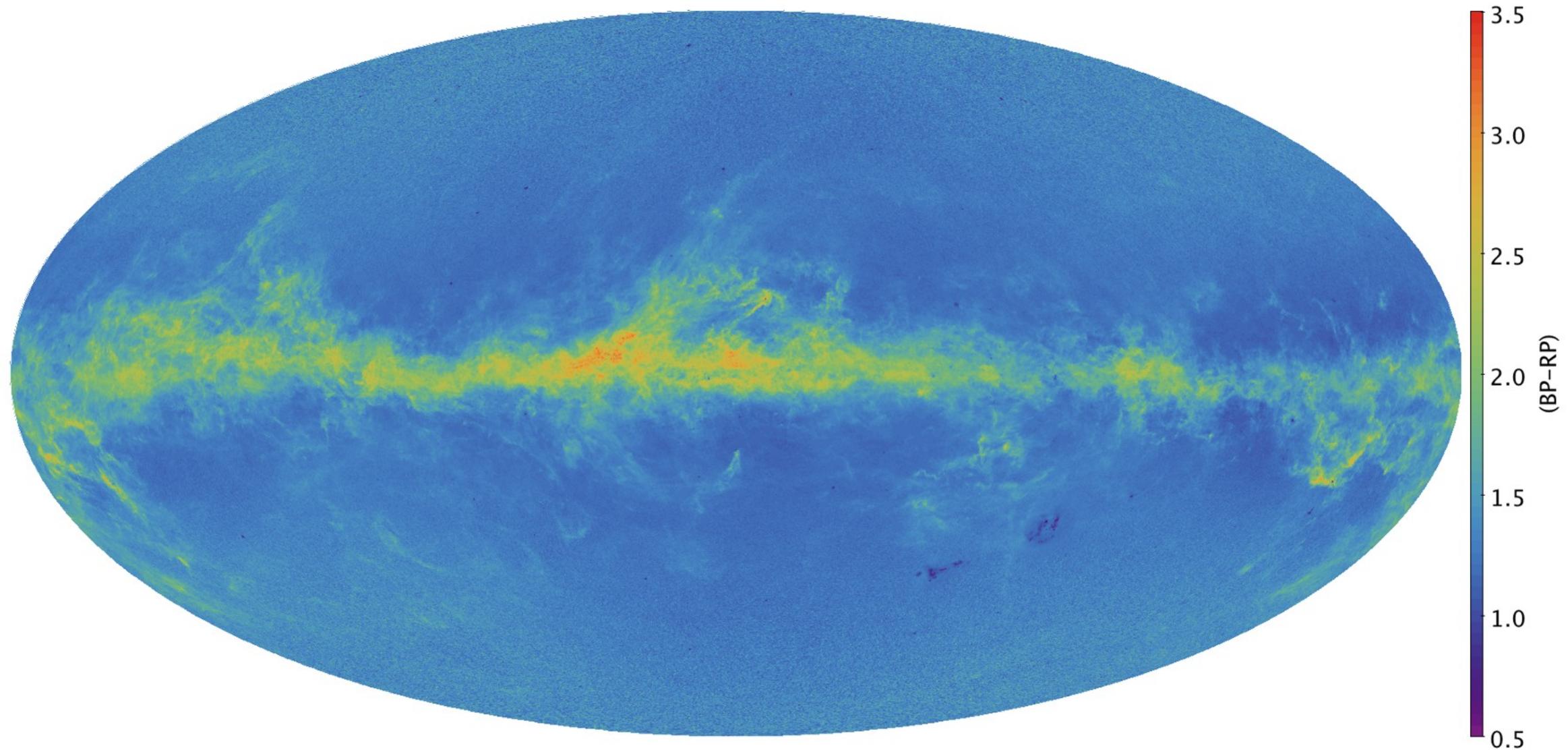
- Systematic errors below 0.1 mas
- Spatial correlations at  $\sim 1$  and  $\sim 20$  degree scales
- Bright star performance calibration limited

# Photometric performance Gaia DR2



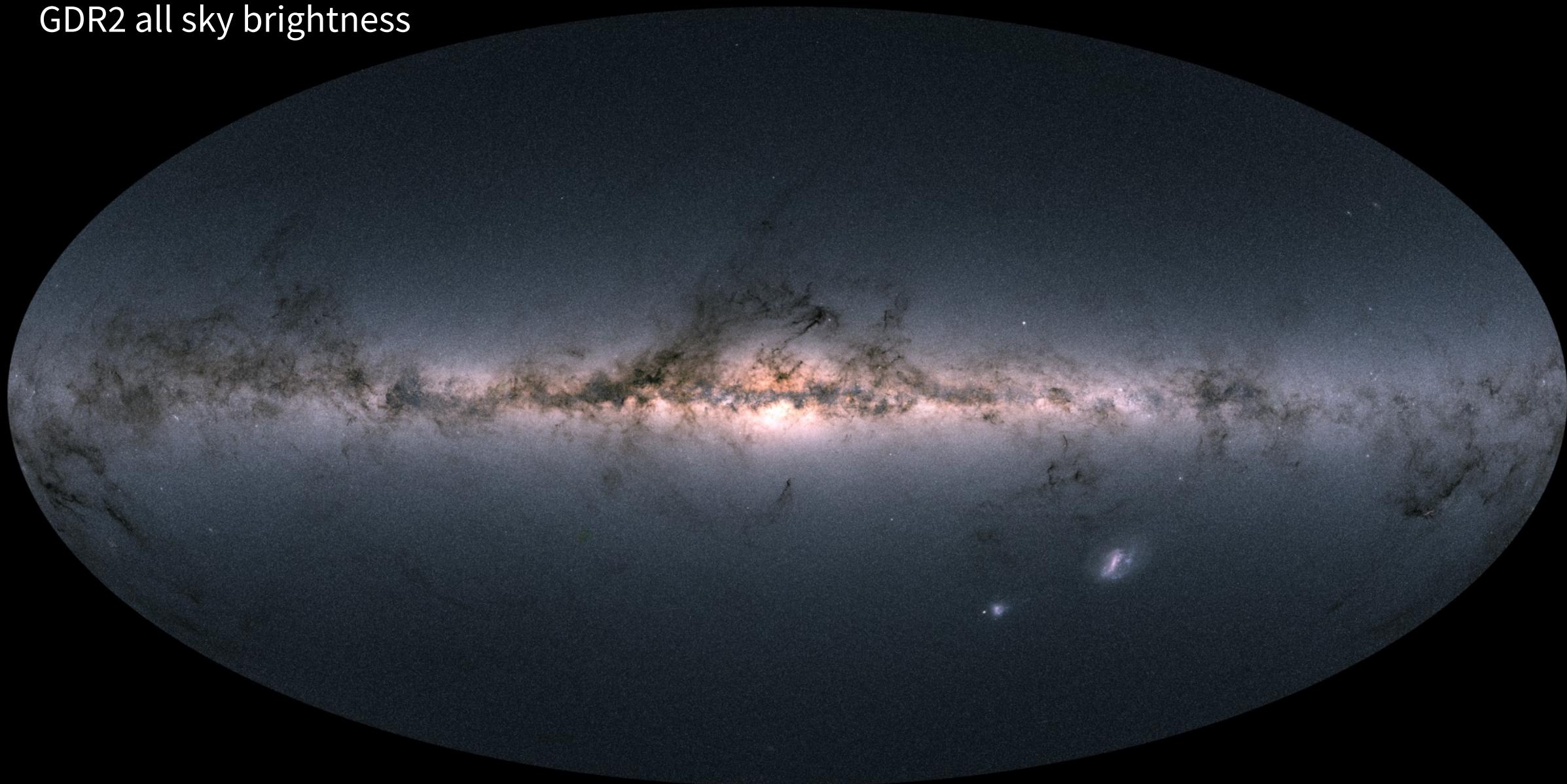
- G-band scatter for sources observed  $\sim 100$  times

# Photometric performance Gaia DR2



Mean colour of the Gaia DR2 sky

GDR2 all sky brightness

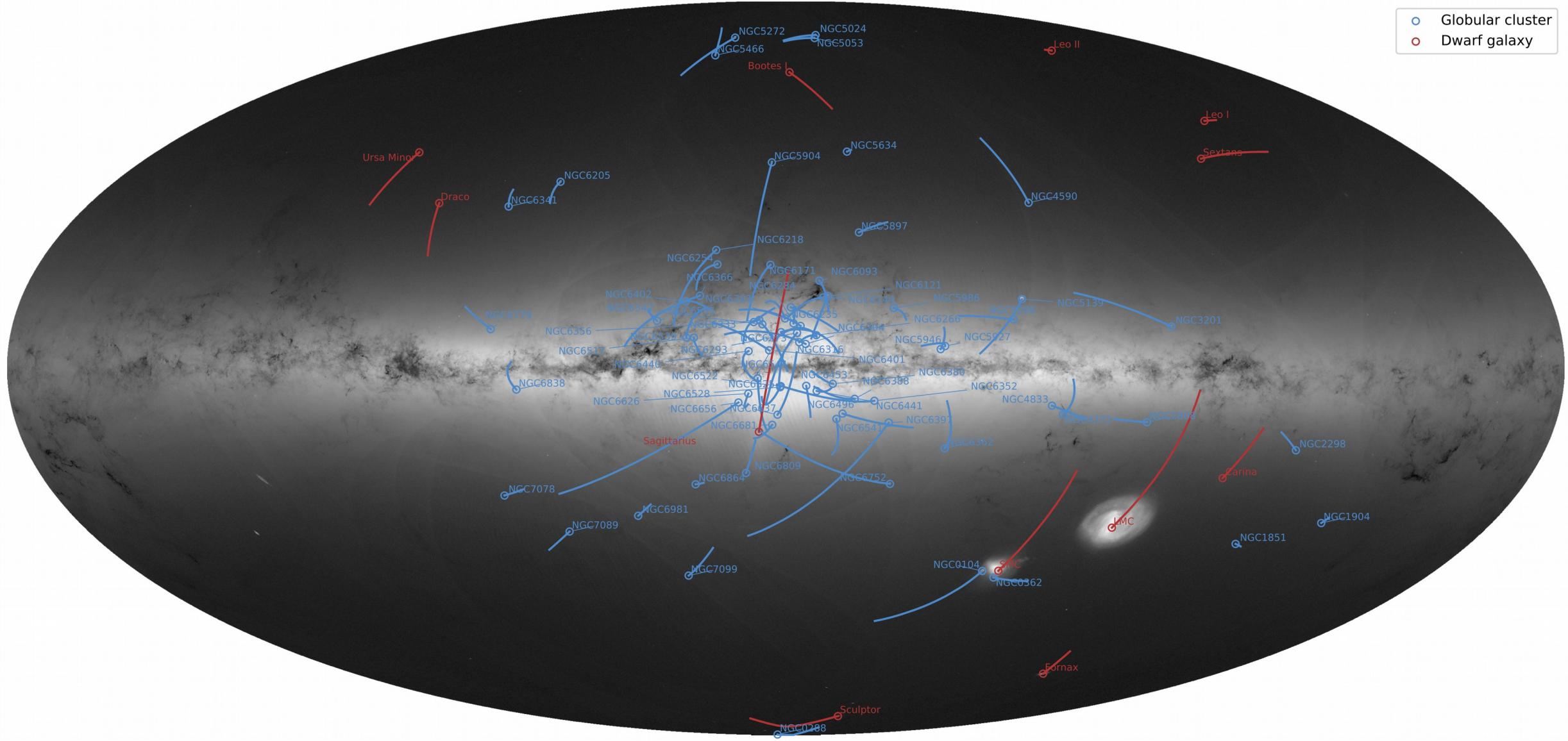


Credit: ESA

# Objectives / Science

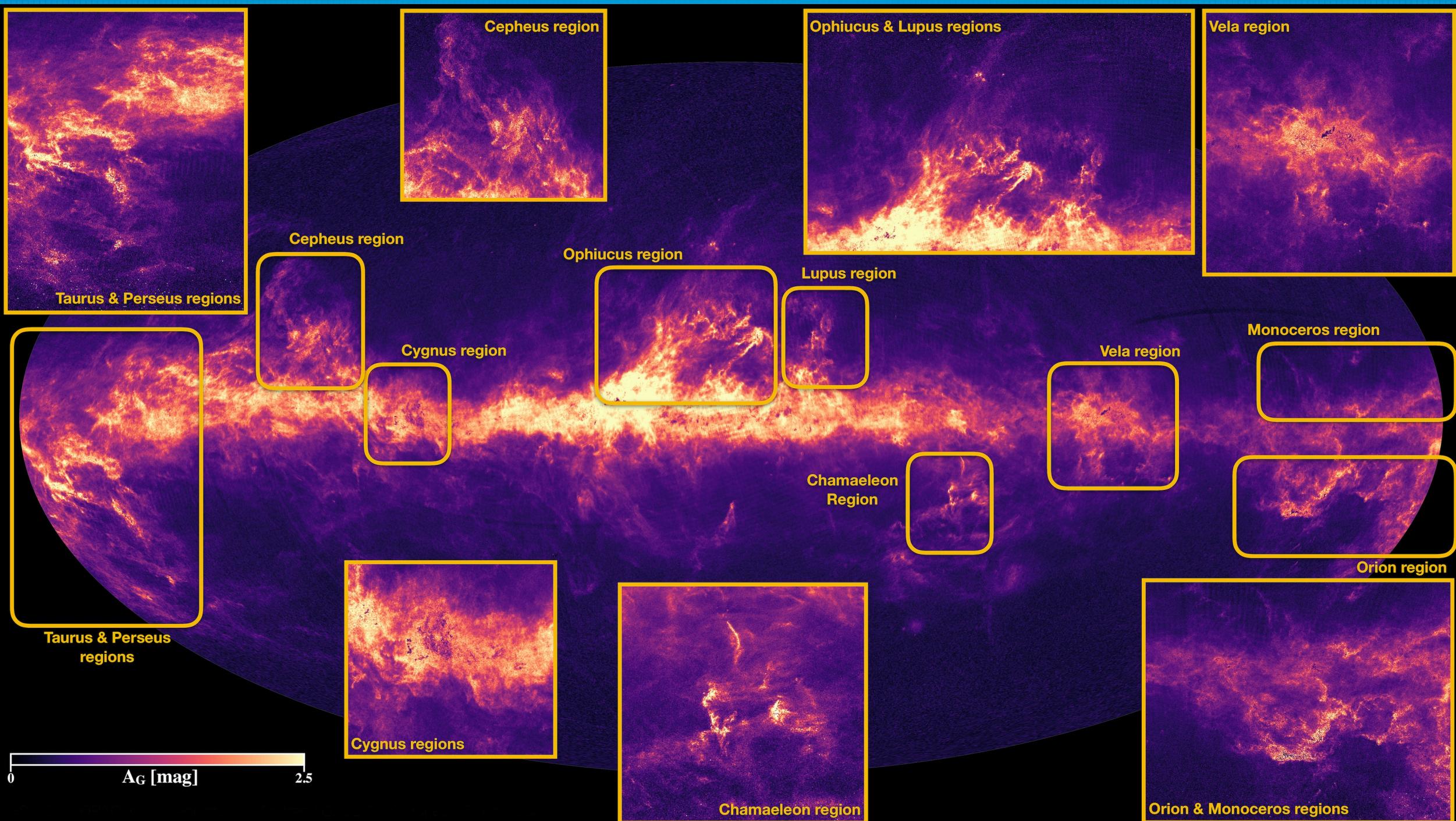
- MW structure / evolution
- Stellar physics
- Exoplanets
- Microlensing
- Asteroids
- Galaxies and quasars
- Variable stars

# GDR2 Science



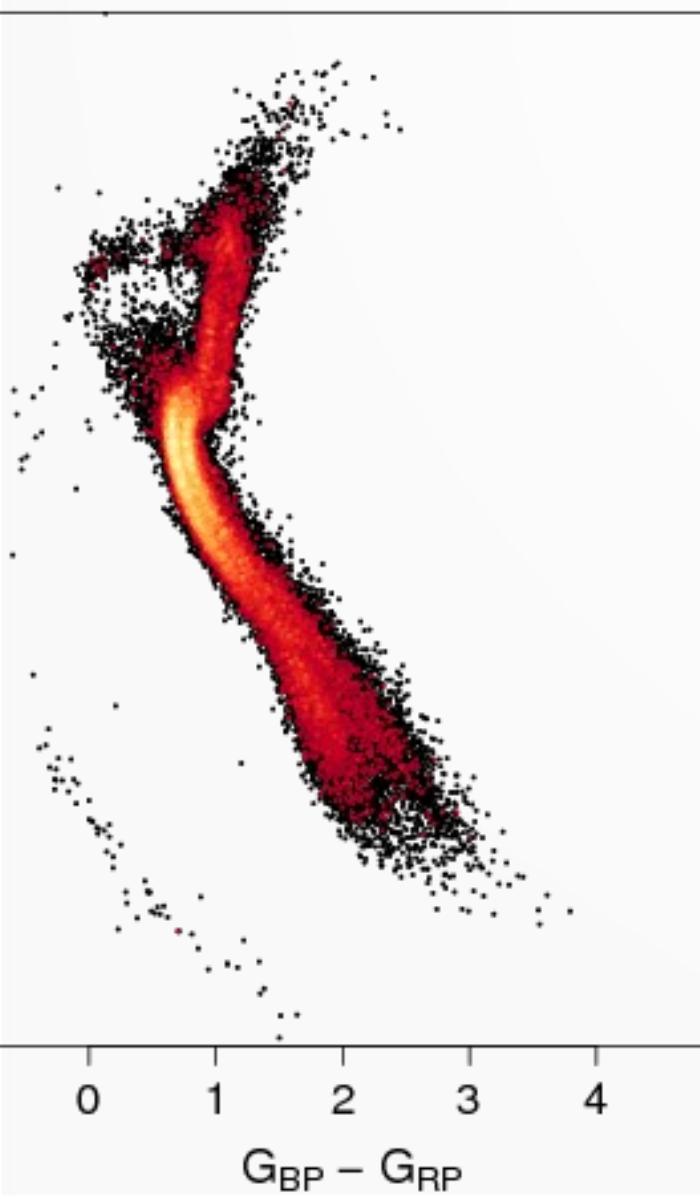
# GDR2 Science

Credit: M. Fouesneau / R. Andrae / C.A.L Bailer-Jones / O. Creevey



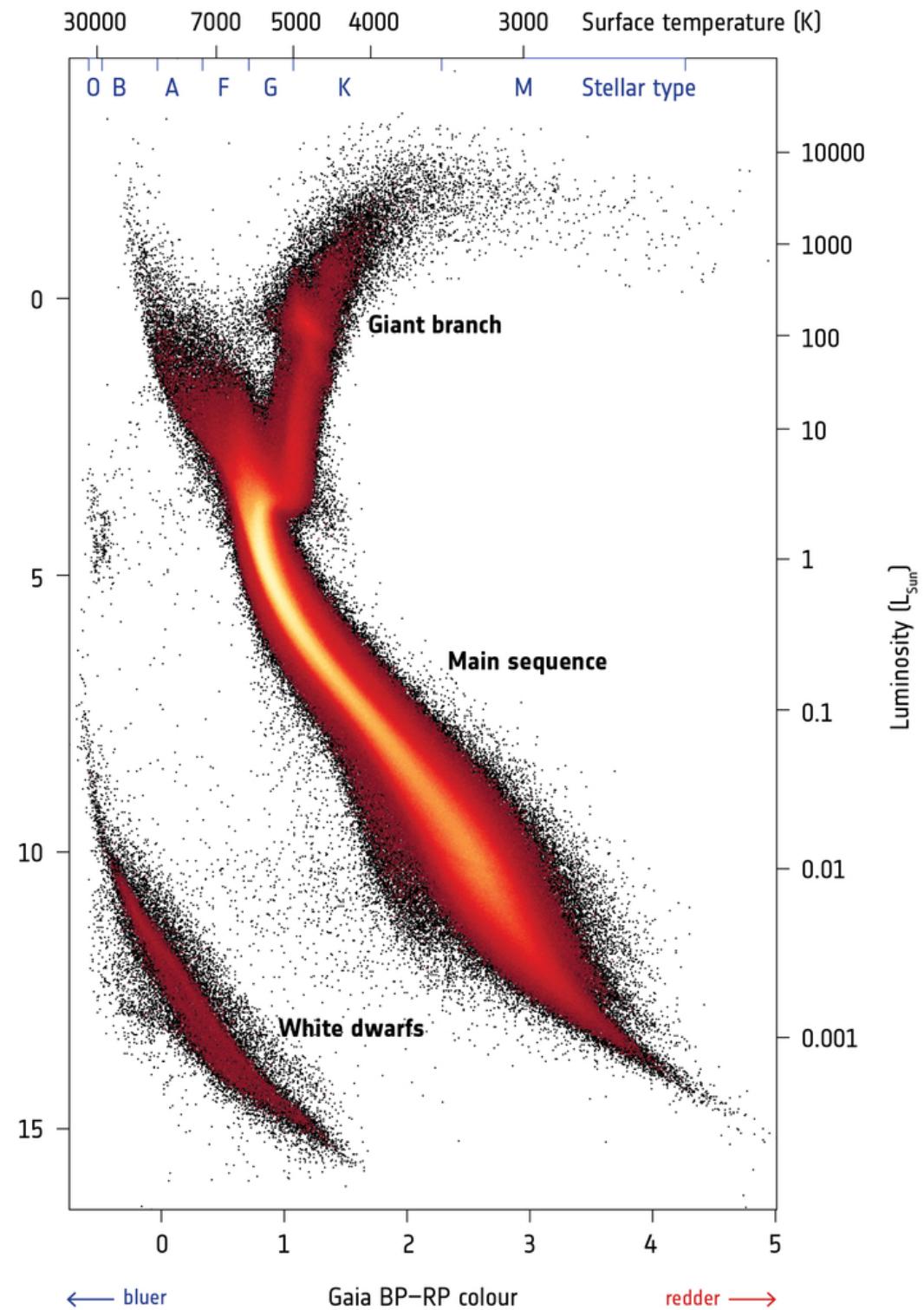
# GDR2 Science

$V_T > 200$  km/s



Absolute G mag

A&A, 616 (2018) A10



← bluer

Gaia BP-RP colour

redder →

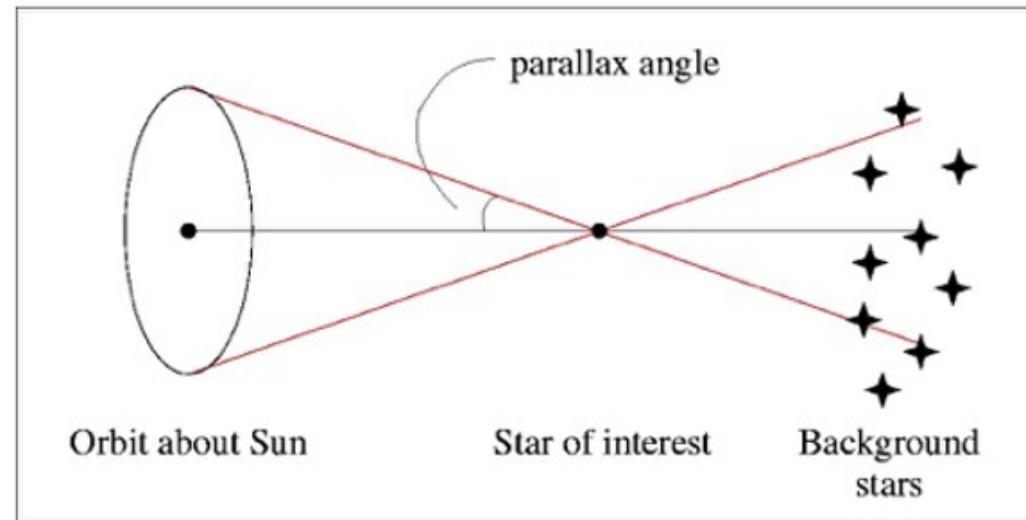
# Preparation for after coffee break

- Can all enter the Shuttle (name: hgsfpXX, pw: hgsfp2018)?

# Backup

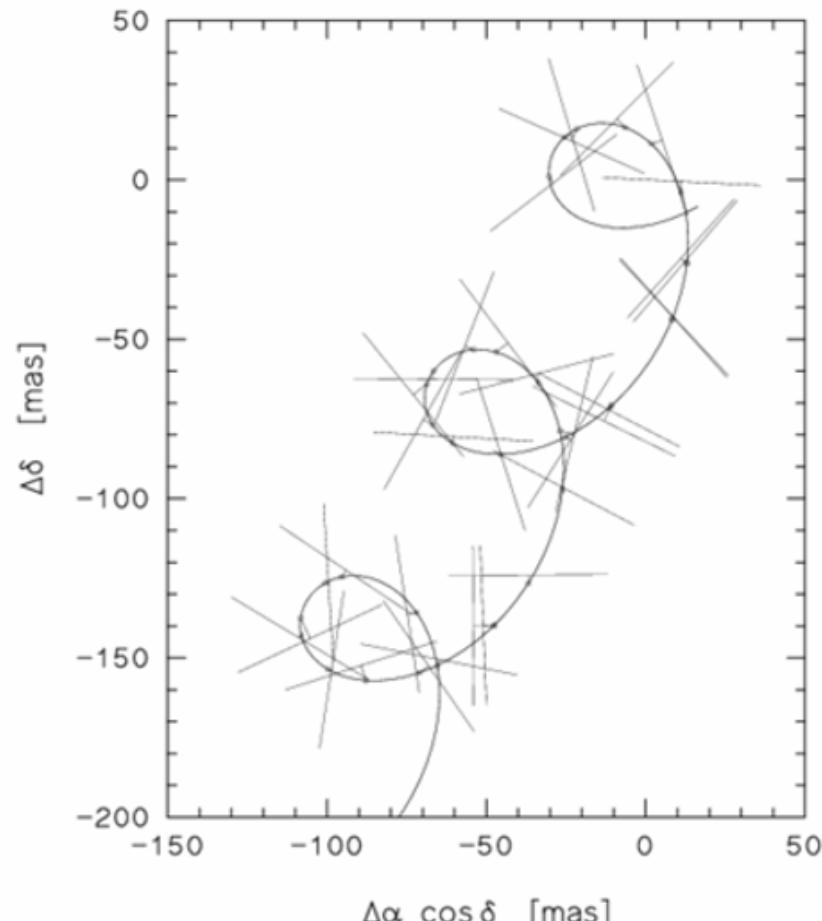
## Astrometry

Gaia orbits Sun to create parallax effect

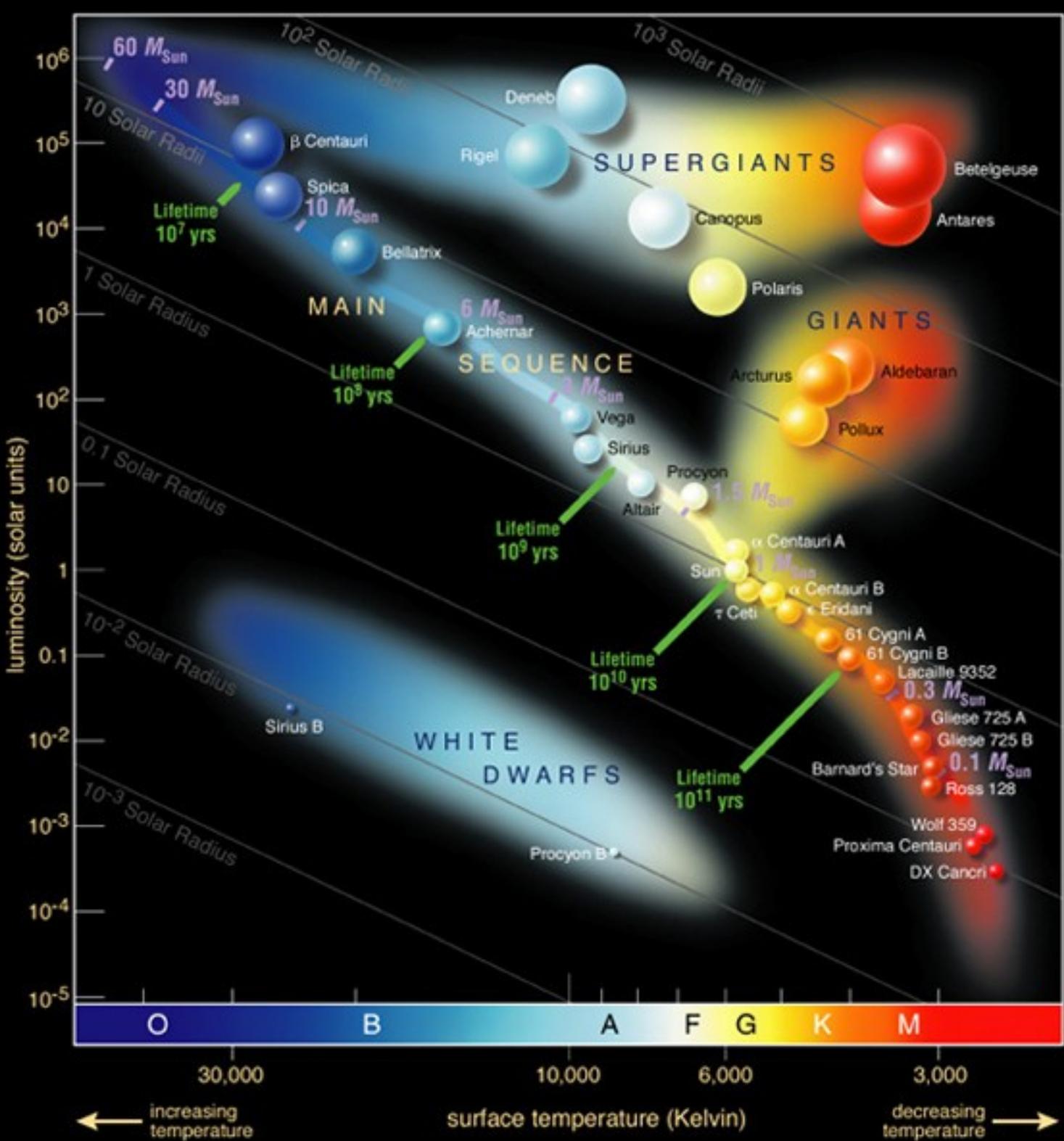


Six dimensions of phase space

- positions: right ascension, declination
- distance (from parallax)
- tangential velocities (from proper motions and parallax)
- radial velocity



# HRD



Credit: ESO

# MW

## → ANATOMY OF THE MILKY WAY

