

# *Gaia* DR2 and the Hubble Constant

Victor Chan & Jo Bovy

Manuscript *in prep*

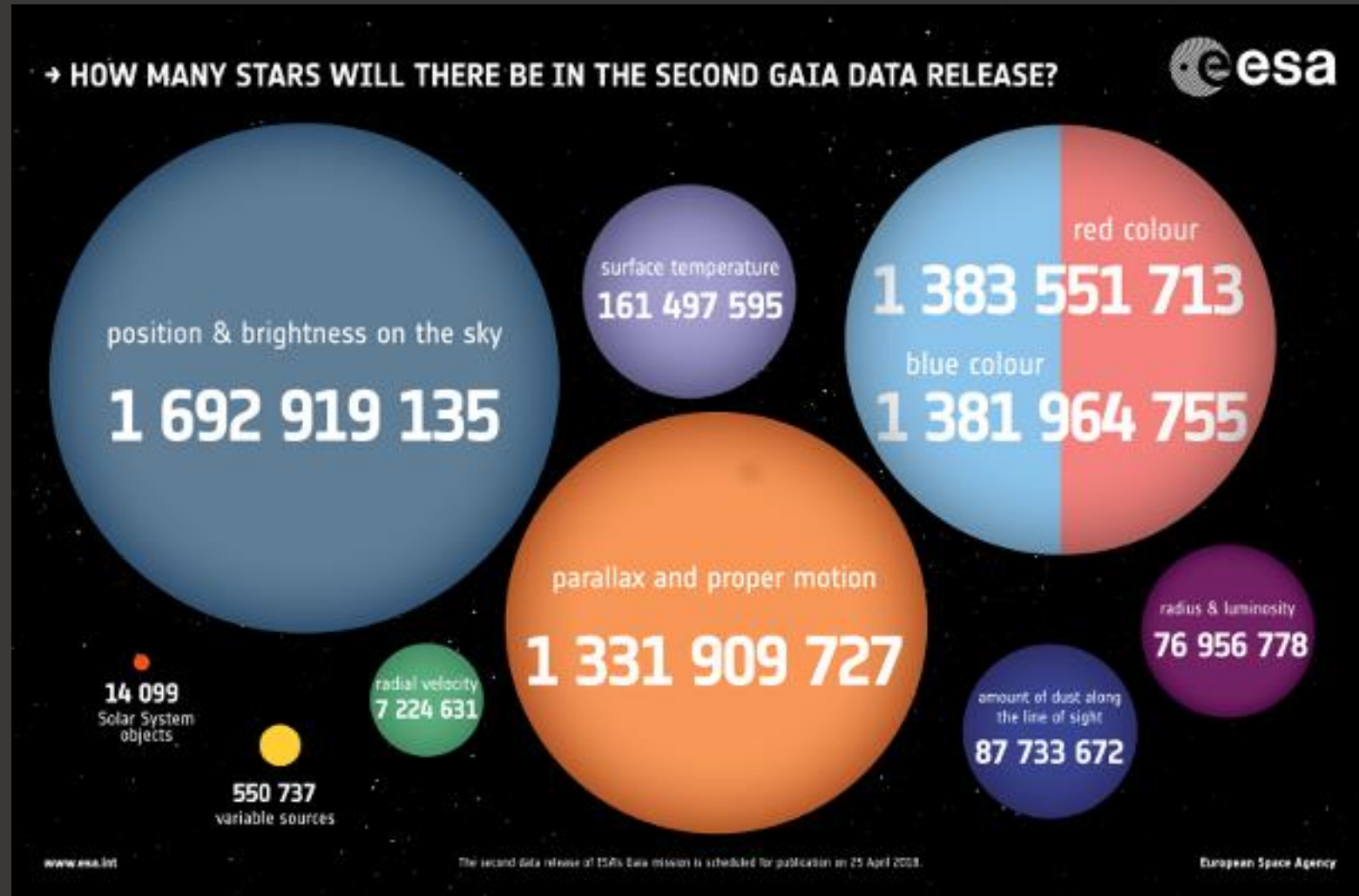
17 July 2019

KITP – Tensions between Early & Late Universe



Astronomy & Astrophysics  
UNIVERSITY OF TORONTO

# Gaia is a fantastic resource!



Courtesy  
of ESA

# ... but the parallaxes are a bit too small

Lindgren++ 2018; *Gaia* Data Release 2: The Astrometric Solution

*Results.* For the sources with five-parameter astrometric solutions, the median uncertainty in parallax and position at the reference epoch J2015.5 is about 0.04 mas for bright ( $G < 14$  mag) sources, 0.1 mas at  $G = 17$  mag, and 0.7 mas at  $G = 20$  mag. In the proper motion components the corresponding uncertainties are 0.05, 0.2, and 1.2 mas yr<sup>-1</sup>, respectively. The optical reference frame defined by *Gaia* DR2 is aligned with ICRS and is non-rotating with respect to the quasars to within 0.15 mas yr<sup>-1</sup>. From the quasars and validation solutions we estimate that systematics in the parallaxes depending on position, magnitude, and colour are generally below 0.1 mas, but the **parallaxes are on the whole too small by about 0.03 mas.** Significant spatial correlations of up to 0.04 mas in parallax and 0.07 mas yr<sup>-1</sup> in proper motion are seen on small (<1 deg) and intermediate (20 deg) angular scales. Important statistics and information for the users of the *Gaia* DR2 astrometry are given in the appendices.

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Riess++ 2018; 2018ApJ...861..126R

of 5 millimag per observation. We use the new *Gaia* DR2 parallaxes and *HST* photometry to simultaneously constrain the cosmic distance scale and to measure the DR2 parallax zeropoint offset appropriate for Cepheids. We find the latter to be  $-46 \pm 13 \mu\text{as}$  or  $\pm 6 \mu\text{as}$  for a fixed distance scale, higher than found from quasars, as expected, for these brighter and redder sources. The precision of

# The offset varies with magnitude, colour

Khan++ 2019; 2019gaia.confE..13K

$-52$  and  $-48 \mu\text{as}$  for RGB and RC stars, respectively. The trends with  $G$  are also relatively flat, resulting in small fluctuations as we move from low to high  $G$  magnitudes: from  $-58$  to  $-51 \mu\text{as}$  for stars on the RGB, and from  $-46$  to  $-52 \mu\text{as}$  in the clump.

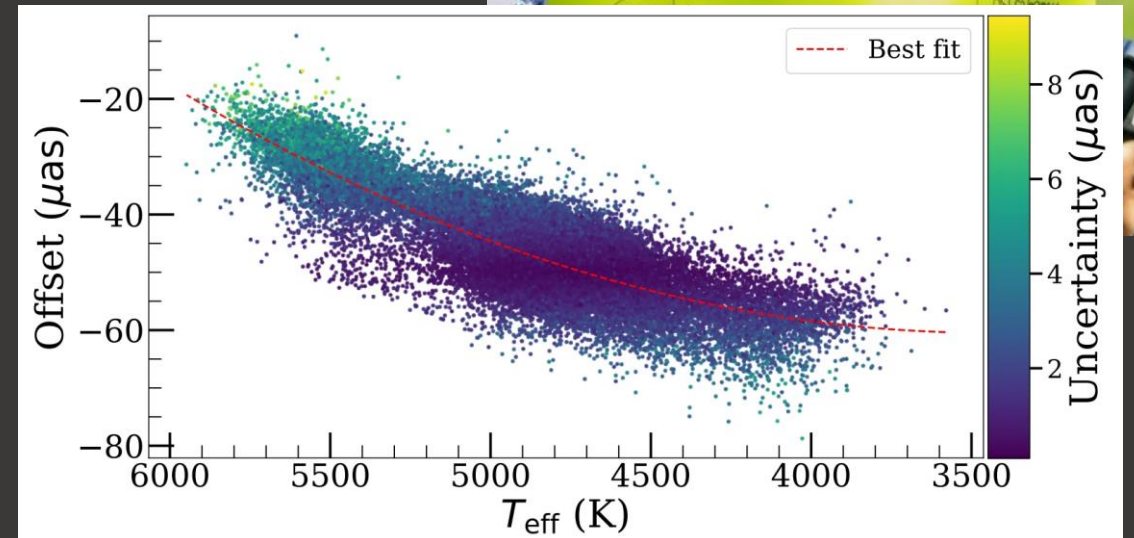
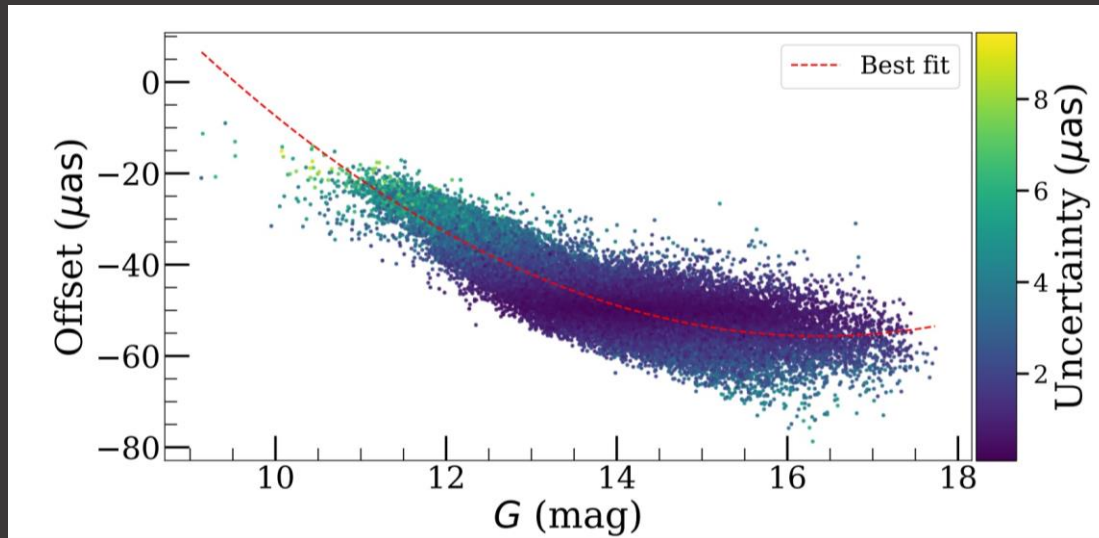


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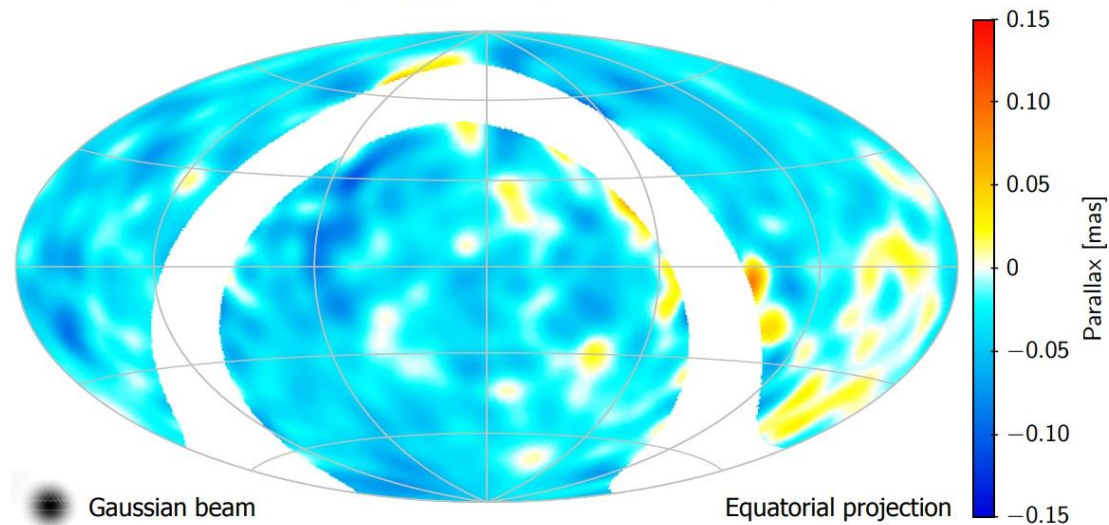
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Leung & Bovy 2019; arXiv:1902.08634 (Submitted to MNRAS)



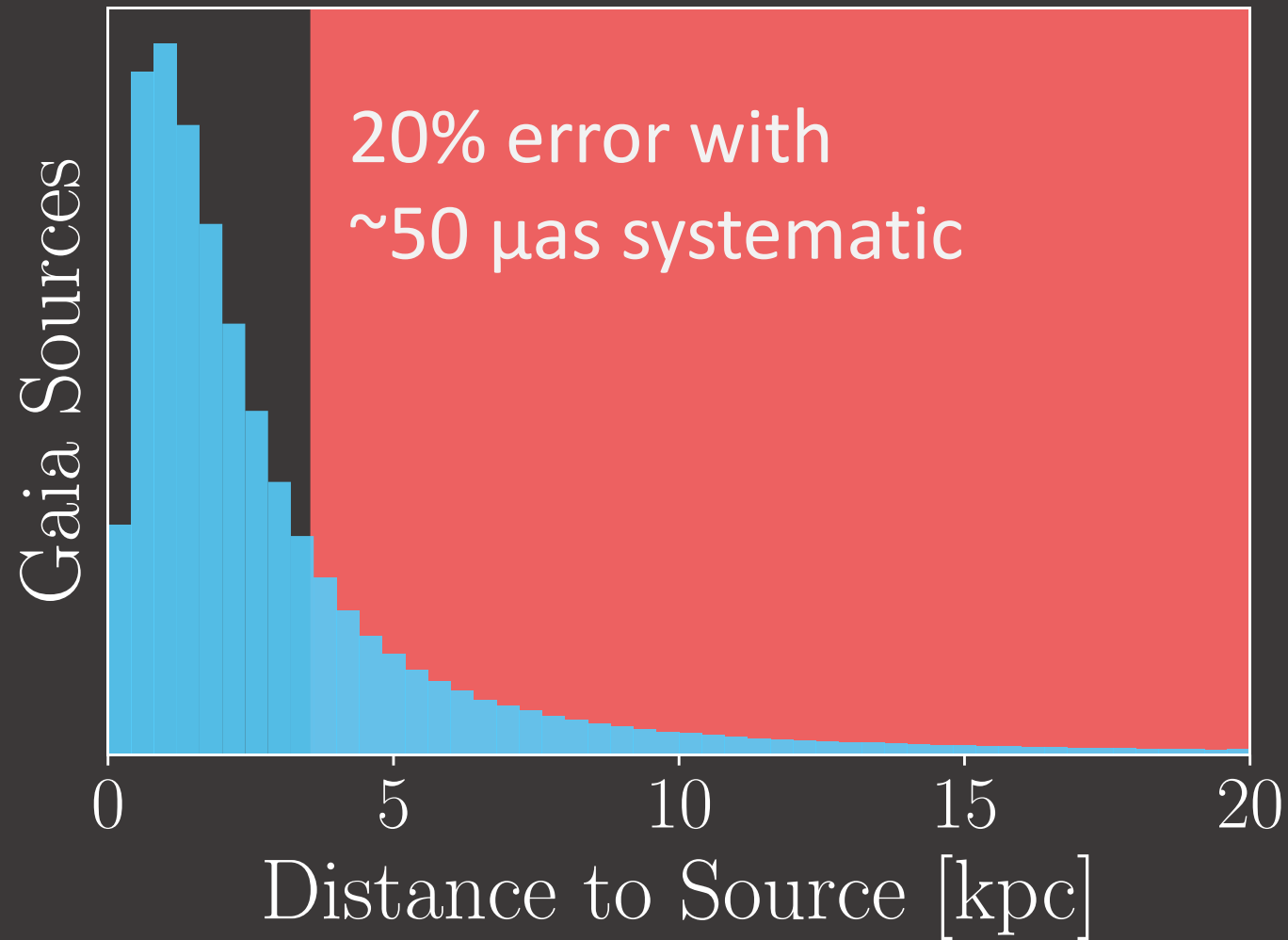
# The offset varies with sky position!

QSO parallaxes smoothed by a Gaussian beam ( $\sigma = 3.7^\circ$ )  
(only  $|\sin b| > 0.2$  shown)



Mean value =  $-0.030$  mas, RMS of smoothed values =  $0.020$  mas

Close to 25% of DR2 parallaxes are affected...





# Accurate distance anchors are essential to local $H_0$ measurements

**Table 6.** Recent  $H_0$  Error Budgets (%)

Term	Description	Riess+ (2016)			Here		
		LMC	MW	4258	LMC	MW	4258
$\sigma_{\mu,\text{anchor}}$	Anchor distance	2.1	2.1	2.6	1.2	1.5	2.6
$\sigma_{\text{PL},\text{anchor}}$	Mean of $P-L$ in anchor	0.1	...	1.5	0.4	...	1.5
$R\sigma_{\lambda,1,2}$	zeropoints, anchor-to-hosts	1.4	1.4	0.0	0.1	0.7	0.0
$\sigma_Z$	Cepheid metallicity, anchor-hosts	0.8	0.2	0.2	0.9	0.2	0.2
	subtotal per anchor	2.6	2.5	3.0	1.5	1.7	3.0
	All Anchor subtotal	1.6			1.0		
$\sigma_{\text{PL}}/\sqrt{n}$	Mean of $P-L$ in SN Ia hosts	0.4			0.4		
$\sigma_{\text{SN}}/\sqrt{n}$	Mean of SN Ia calibrators (# SN)	1.3 (19)			1.3 (19)		
$\sigma_{m-z}$	SN Ia $m-z$ relation	0.4			0.4		
$\sigma_{\text{PL}}$	$P-L$ slope, $\Delta\log P$ , anchor-hosts	0.6			0.3		
	statistical error, $\sigma_{H_0}$	2.2			1.8		
	Analysis systematics <sup>a</sup>	0.8			0.6		
	<b>Total uncertainty on <math>\sigma_{H_0}</math> [%]</b>	<b>2.4</b>			<b>1.9</b>		

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Riess++, 2019

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Typical MW Cepheid

$$r \sim 3 \text{ kpc}$$

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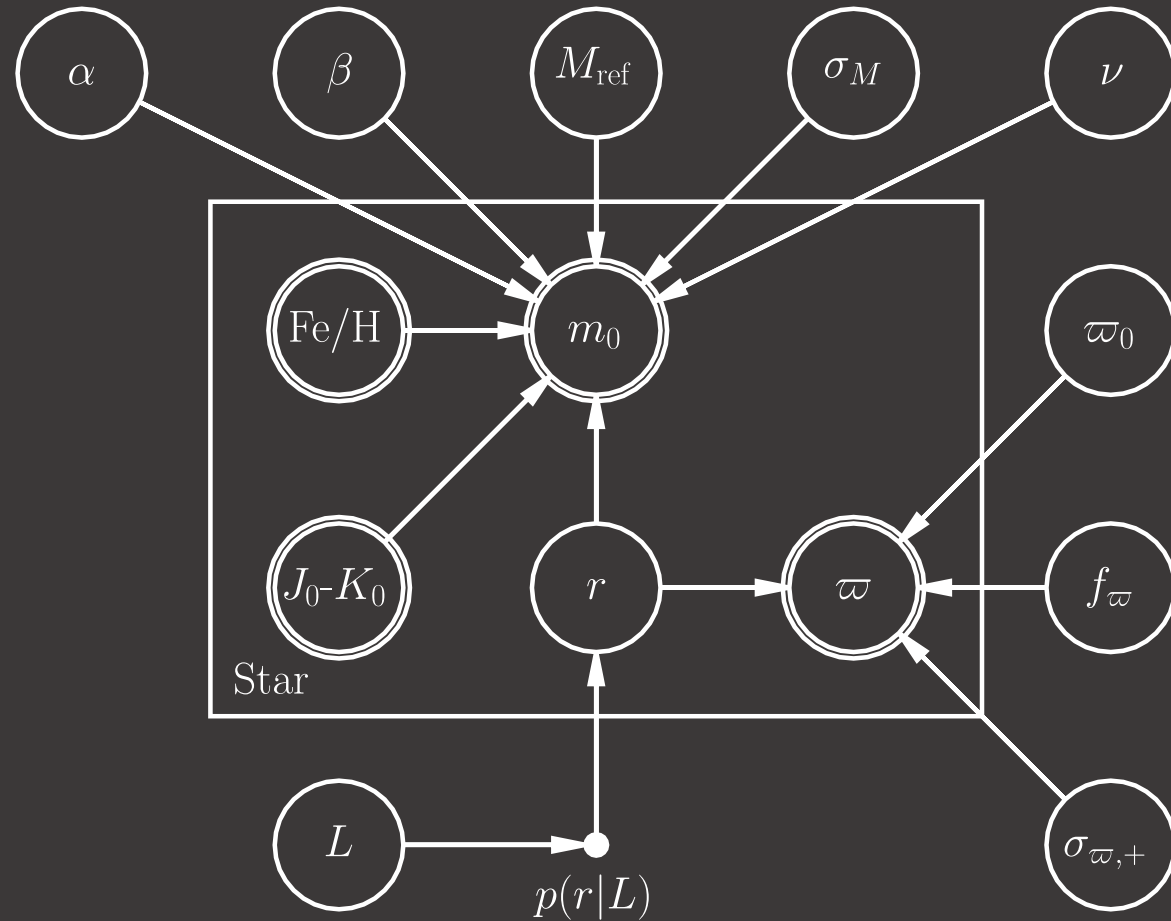
$$N \sim 2500$$

$$\varpi = 1/r \approx 333 \mu\text{as}$$

$$\sigma_{\varpi, \text{sys}} < 5 \mu\text{as}$$



# We build a model describing *Gaia* parallaxes



How is the zero-point parallax modelled?

$$\varpi = 1/r$$

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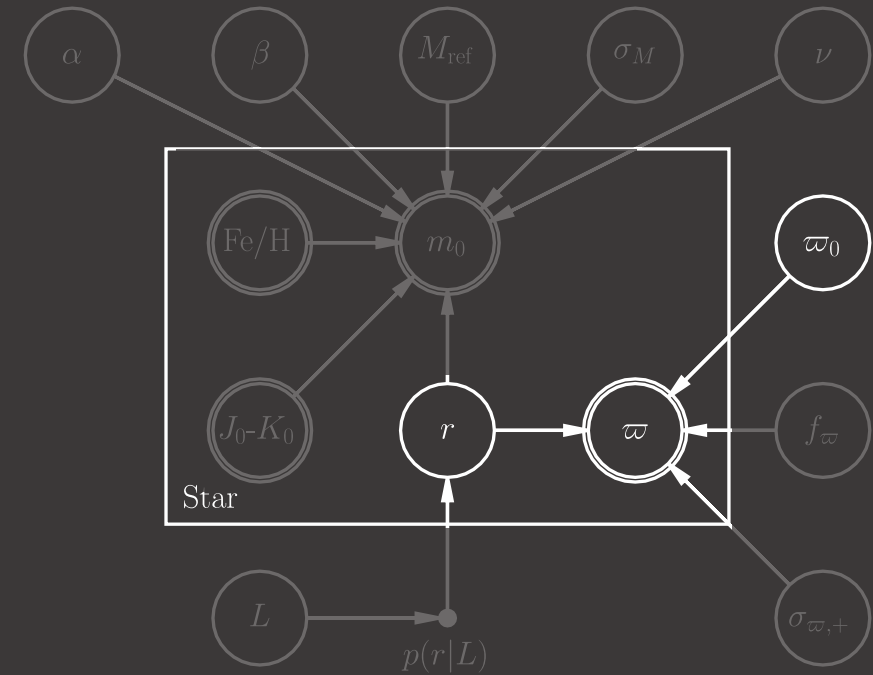
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Hierarchical models can validate *Gaia* parallax errors

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Reported errors

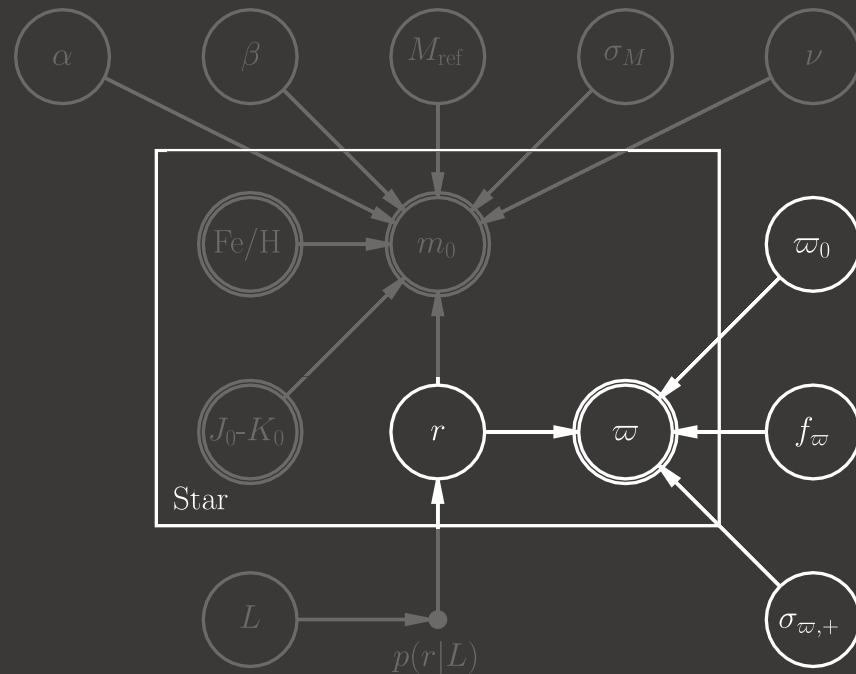
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Correction parameters

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Gaia Data Release 1  
Lindegren++ 2016

$$f_{\varpi} = 1.4$$

$$\sigma_{\varpi,+} = 200 \mu\text{as}$$

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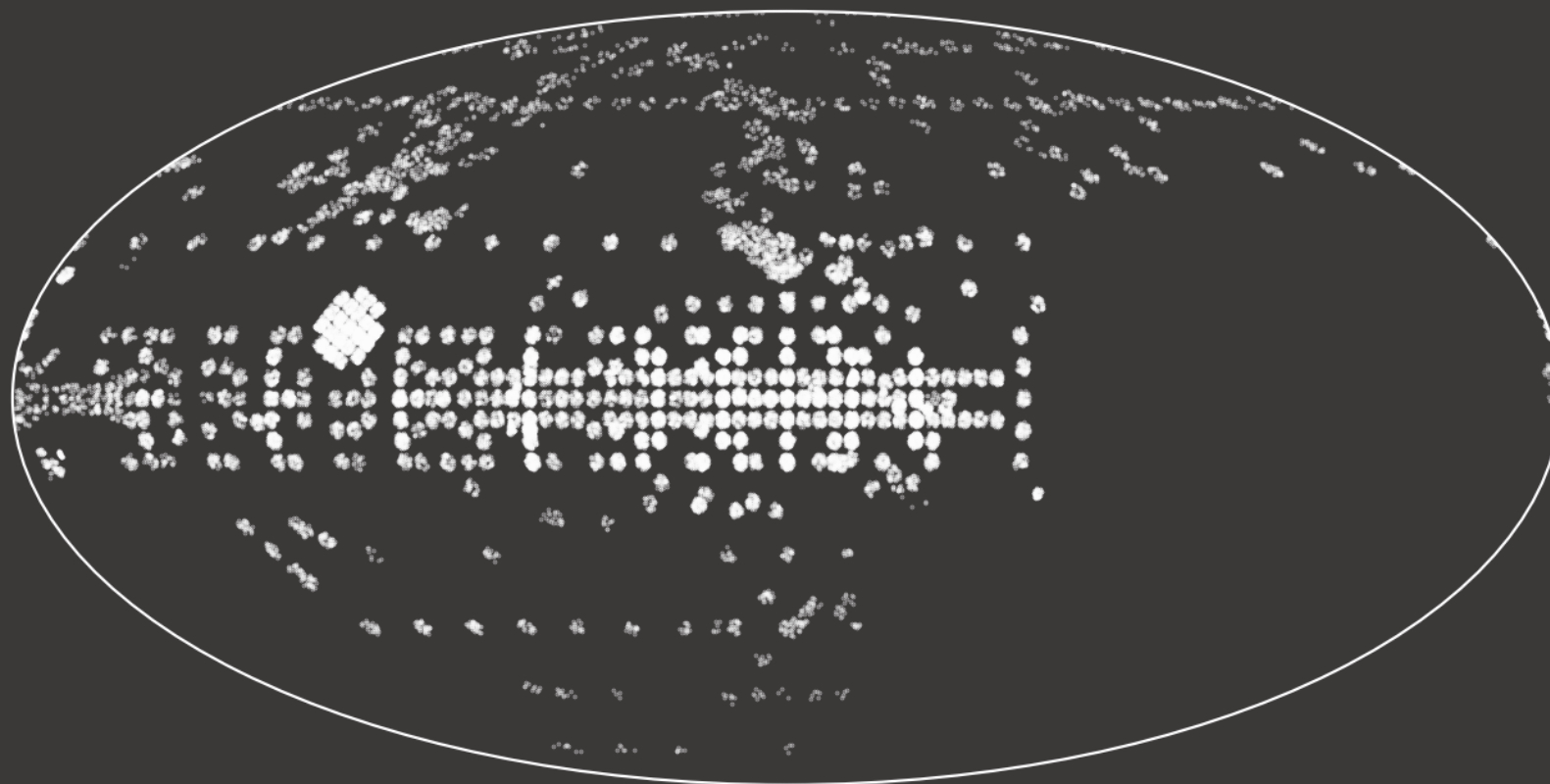
$$\sigma_{\varpi,+} = 200 \mu\text{as}$$

Gaia Data Release 2  
Lindegren++ 2018  
(Tentative)

$$f_{\varpi} = 1.08$$

$$\sigma_{\varpi,+} = 21 - 43 \mu\text{as}$$

# Measuring the zero-point requires lots of data



Red clump stars are standard candles

$$\mu = m - A_m - M = 5 \log r - 5$$

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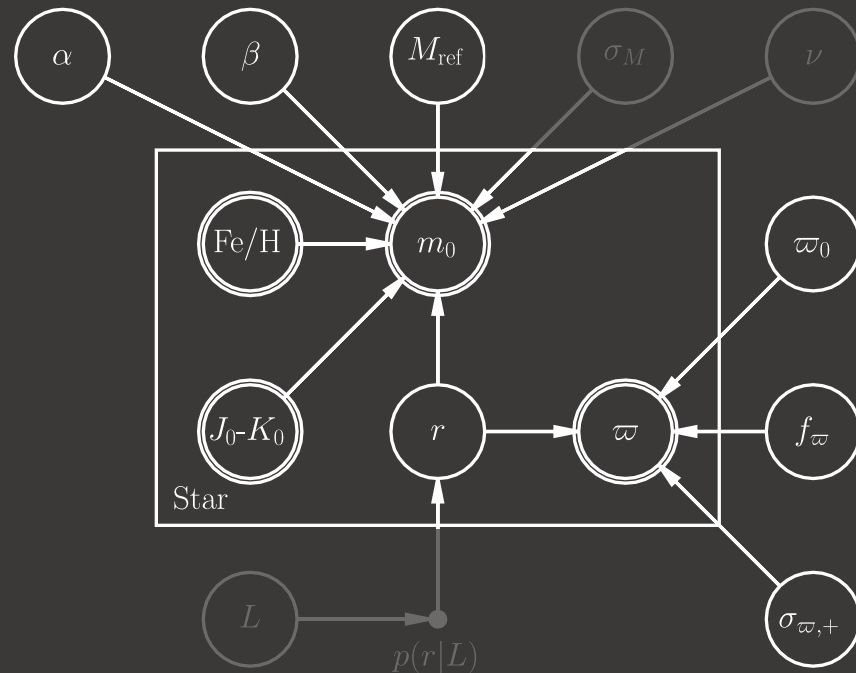
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Luminosity is modelled with stellar properties

$$M \sim \alpha(J_0 - K_0) + \beta[\text{Fe}/\text{H}] + M_{\text{ref}}$$

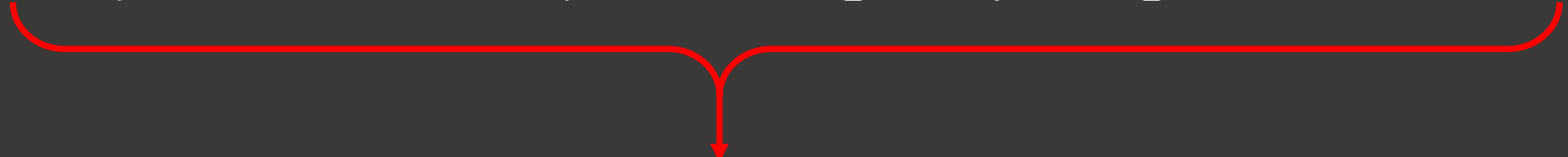
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Model uncertainties outweigh photometric uncertainties (?)

$$\mu_m = m - A_m - M = 5 \log r - 5 = \mu_r$$

$$p(\mu_m | \mu_r)$$

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Student's t-distribution



Model uncertainties outweigh photometric uncertainties (?)

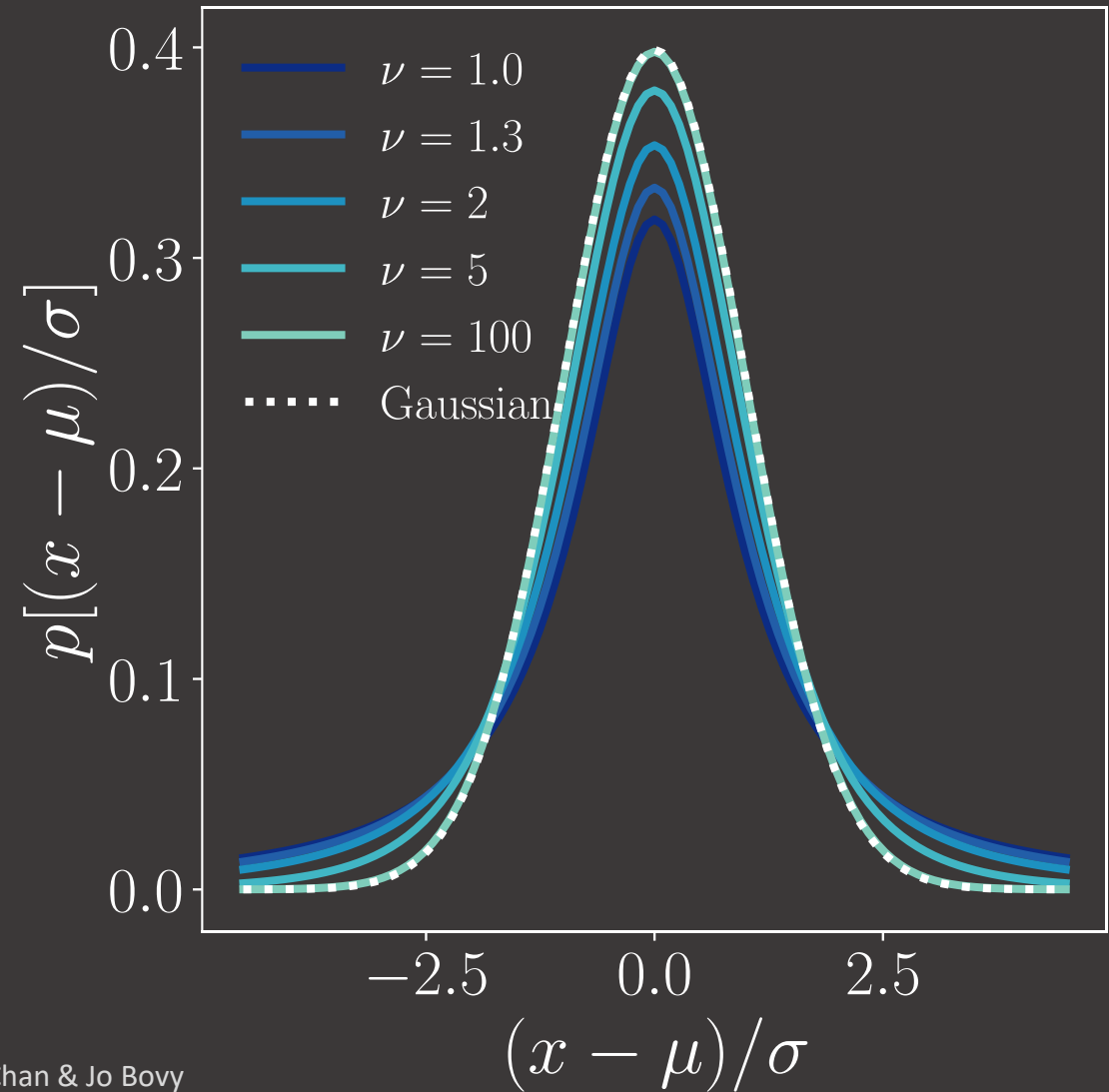
VICTOR READ THIS

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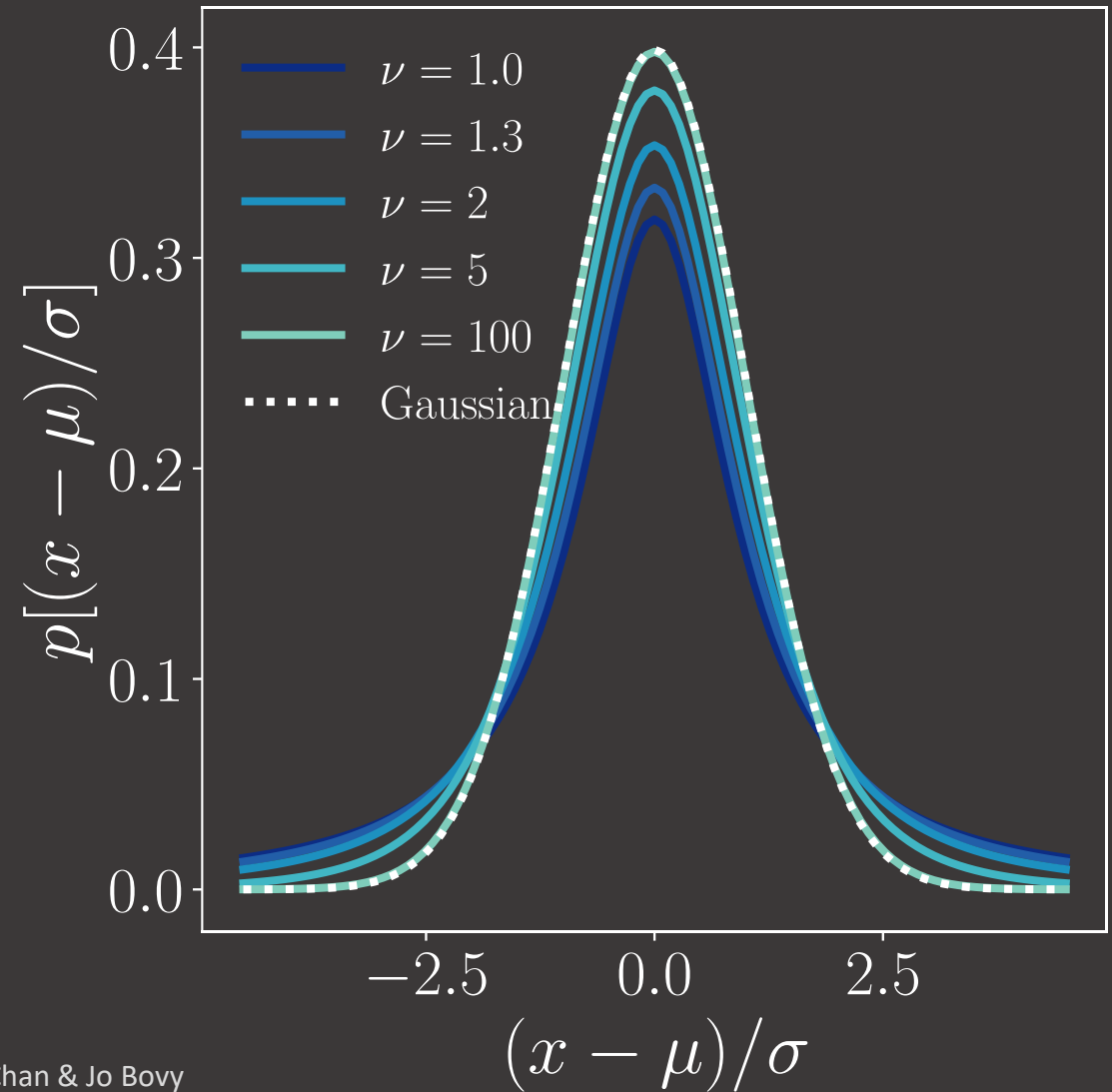
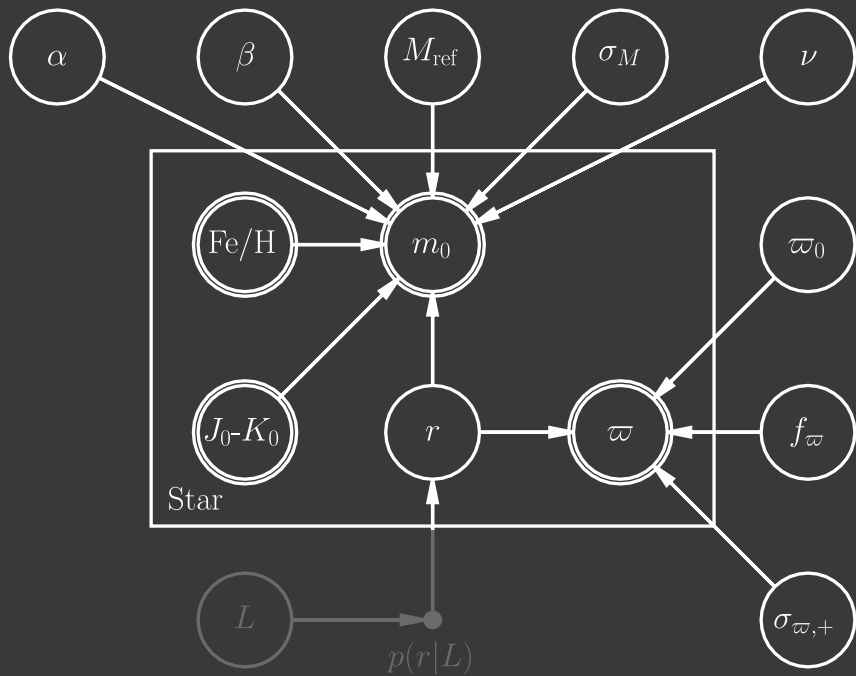
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# The Student's t-distribution catches potential photometric outliers



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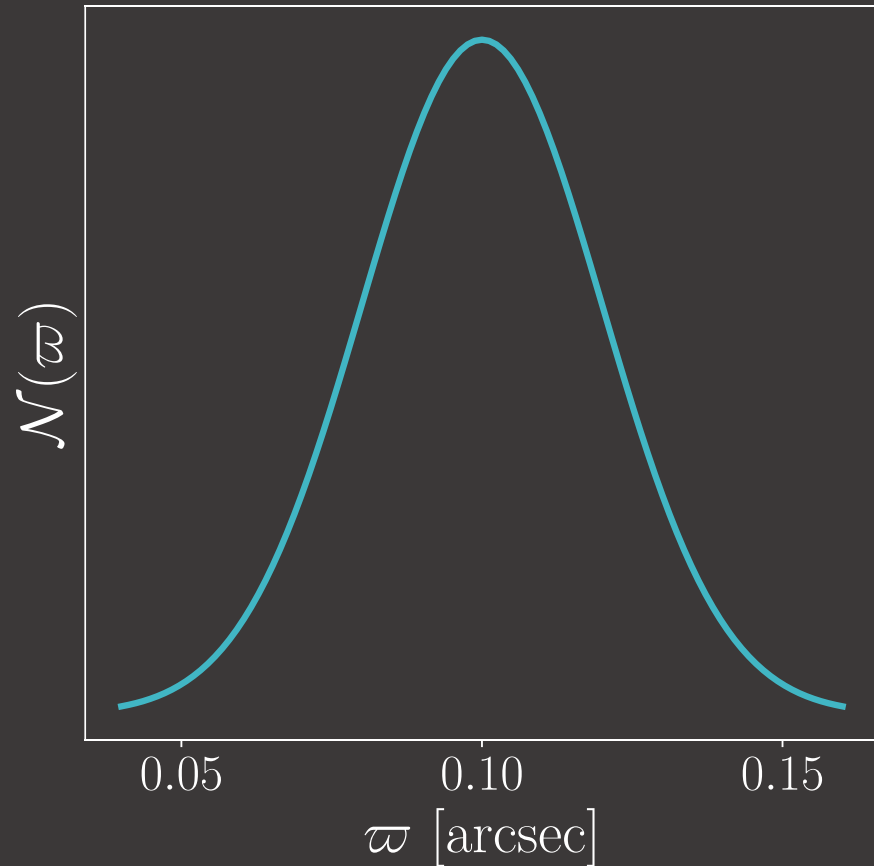


Red clump stars are standard(izable) candles

$$\mu = m - A_m - M = 5 \log r - 5$$

$$\varpi = 1/r + \varpi_0$$

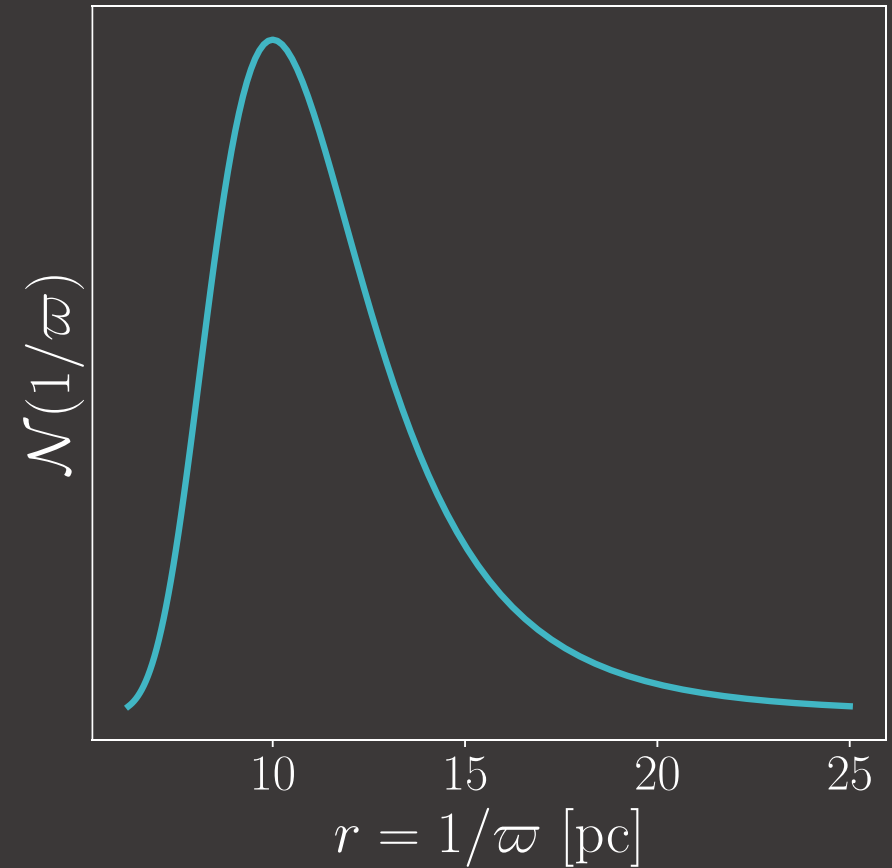
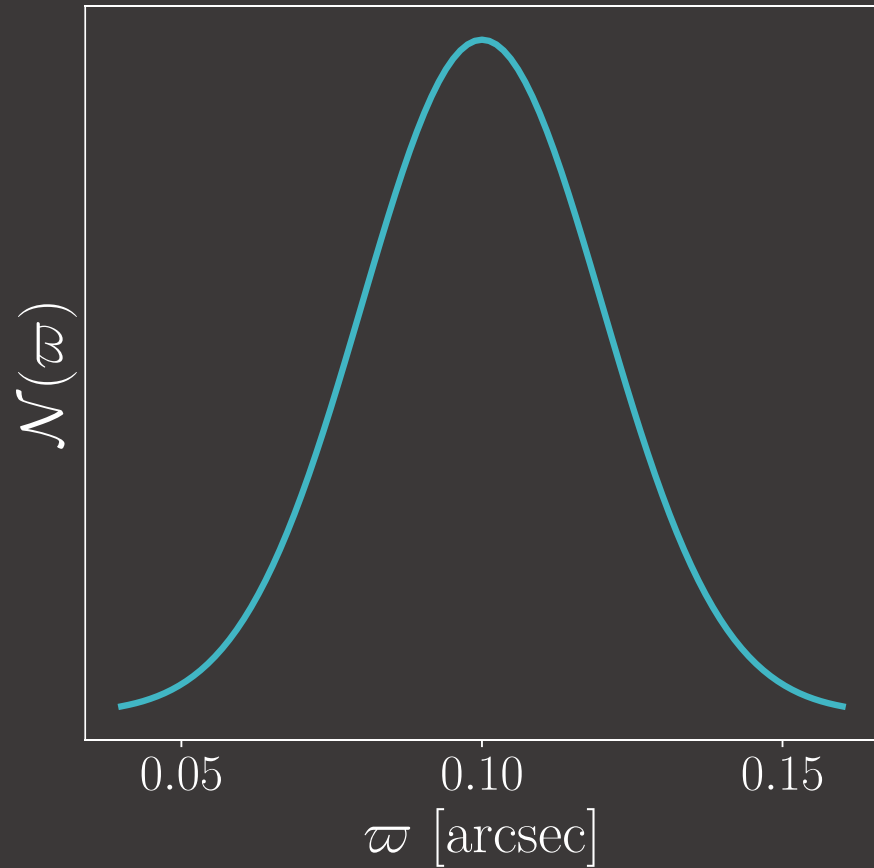

# Inverting parallax is a biased estimator of distance



$$p_{\text{true}} = 0.1 \text{ arcsec}$$

$$\sigma_p = 0.02 \text{ arcsec}$$

# Inverting parallax is a biased estimator of distance



An exponentially decreasing volume density prior resolves estimator bias

$$p(r|L) = \frac{r^2}{2L^3} \exp\left(\frac{-r}{L}\right)$$

Bailer-Jones 2015

In summary, the model relates photometric and parallax measurements through distance

Likelihood

$$\mathcal{N}(\varpi | 1/r + \varpi_0, \sigma_{\varpi}^2)$$

$$\mathcal{S}(\mu_m | \mu_r, \sigma_M^2, \nu)$$

Prior

$$p(r | L)$$



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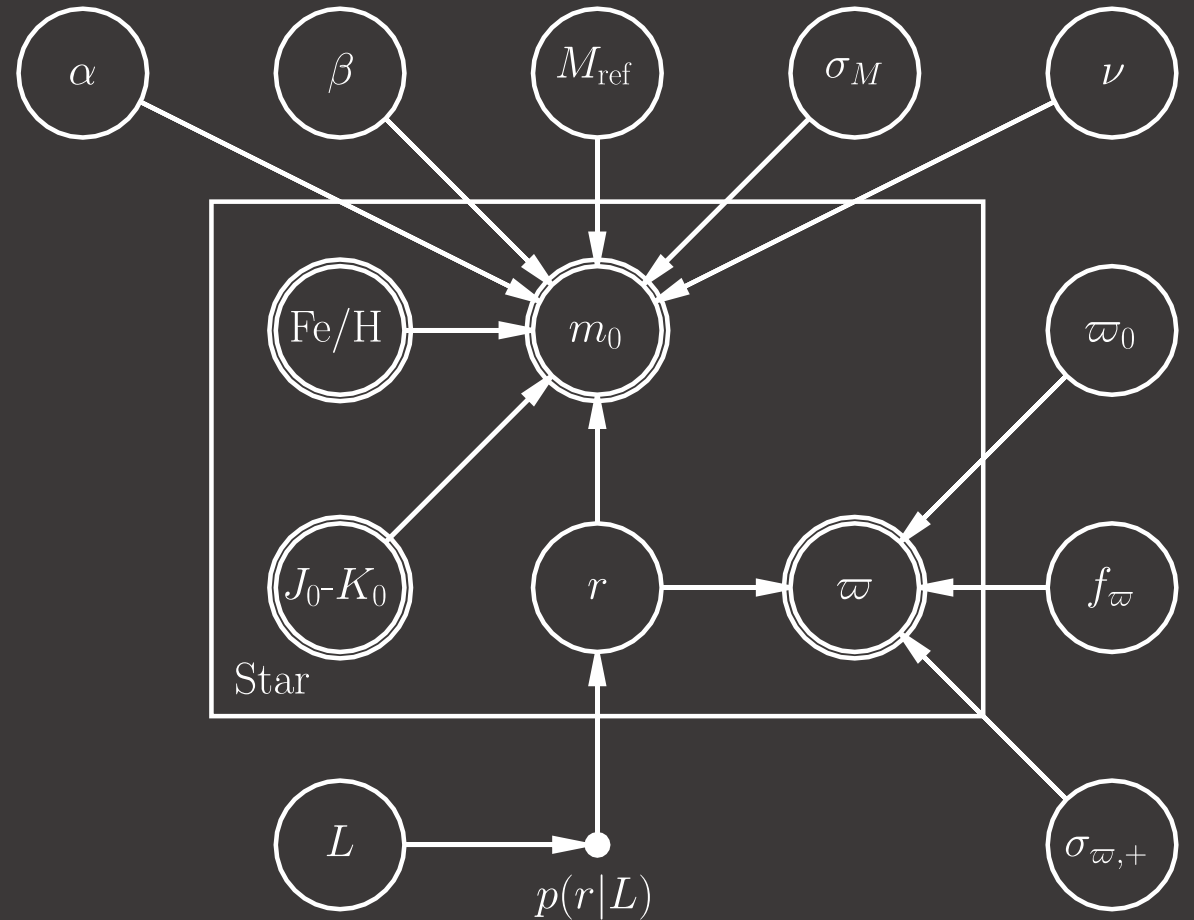
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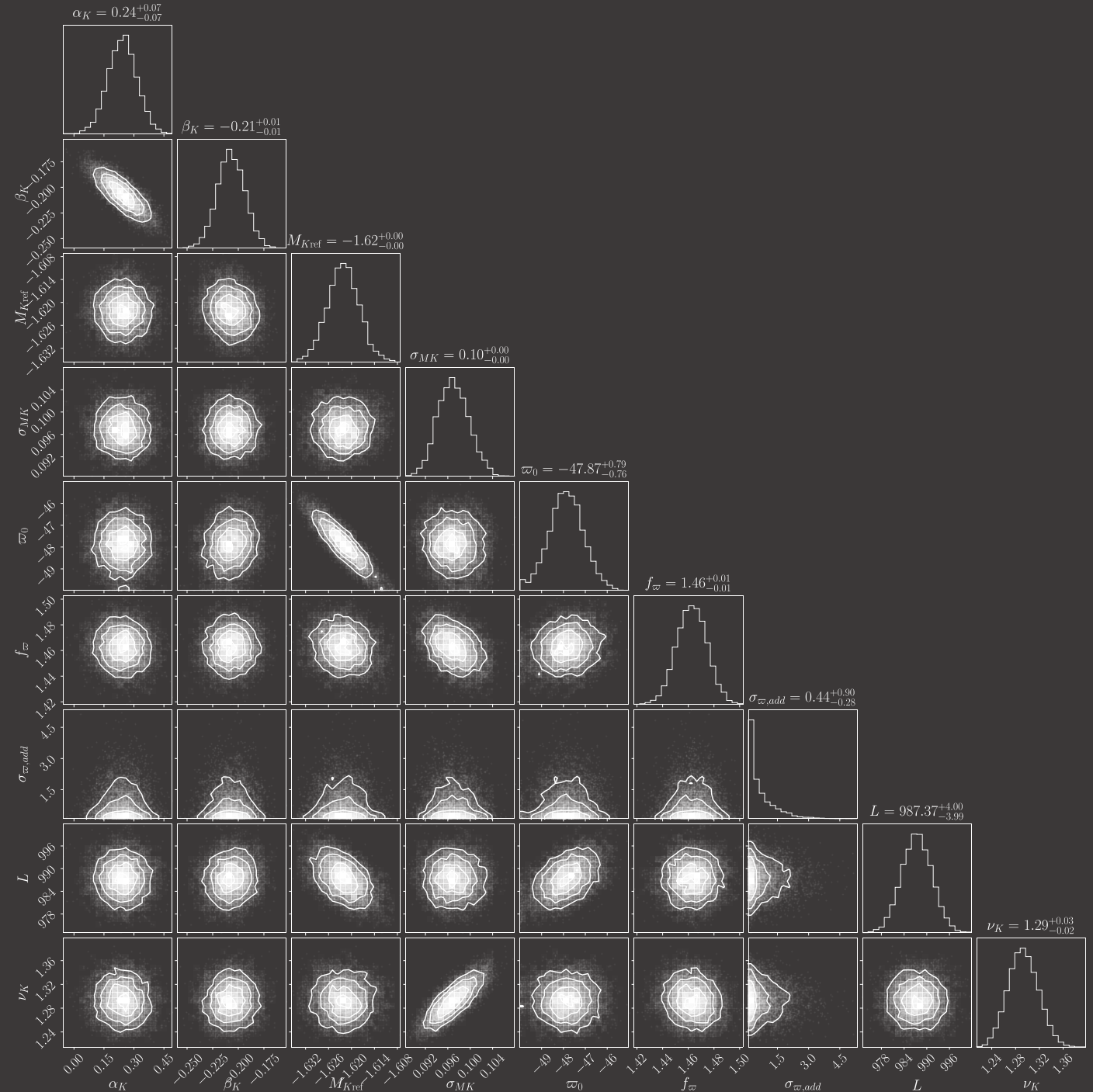
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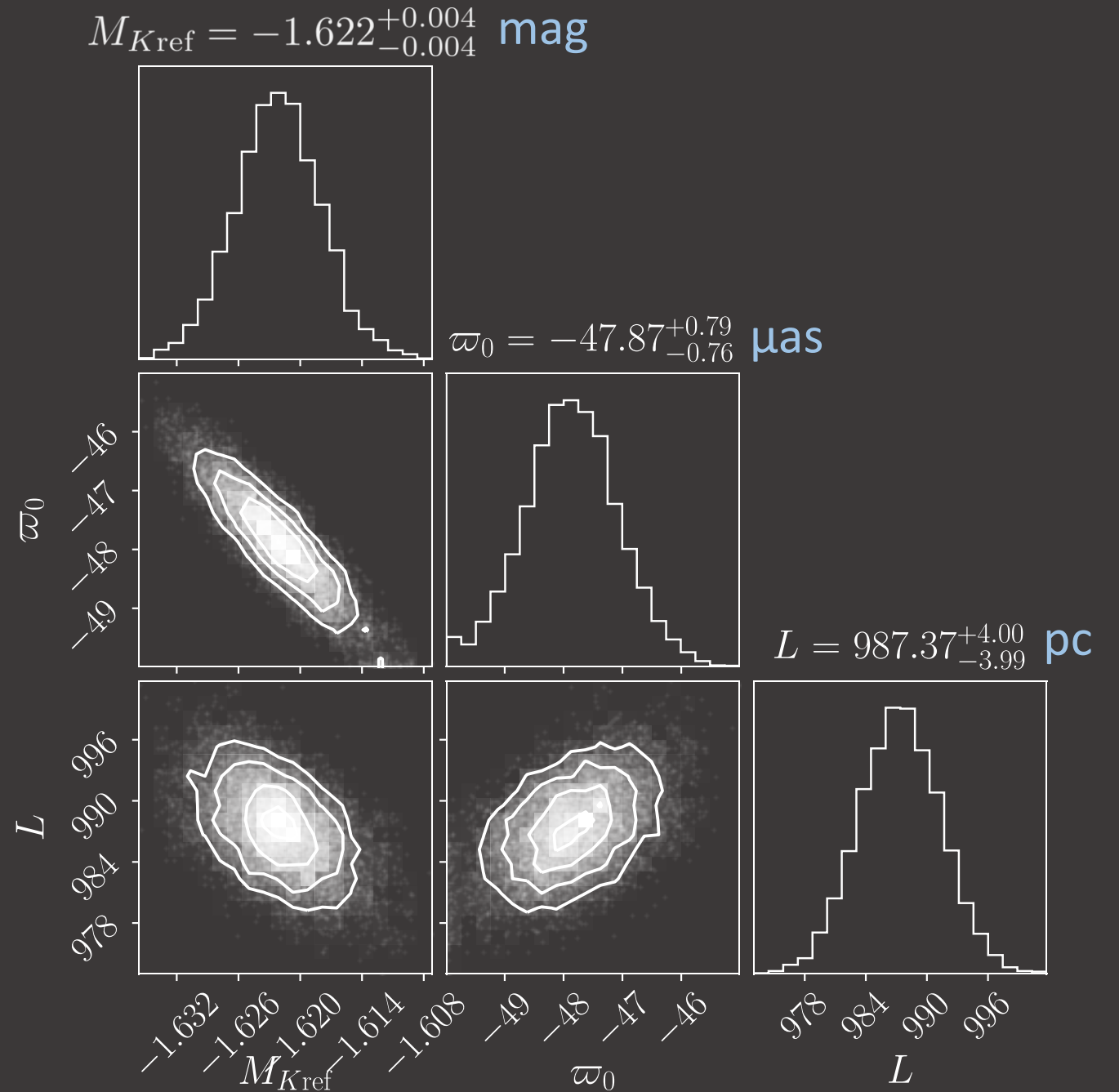


Parameters are  
inferred to very  
high precision

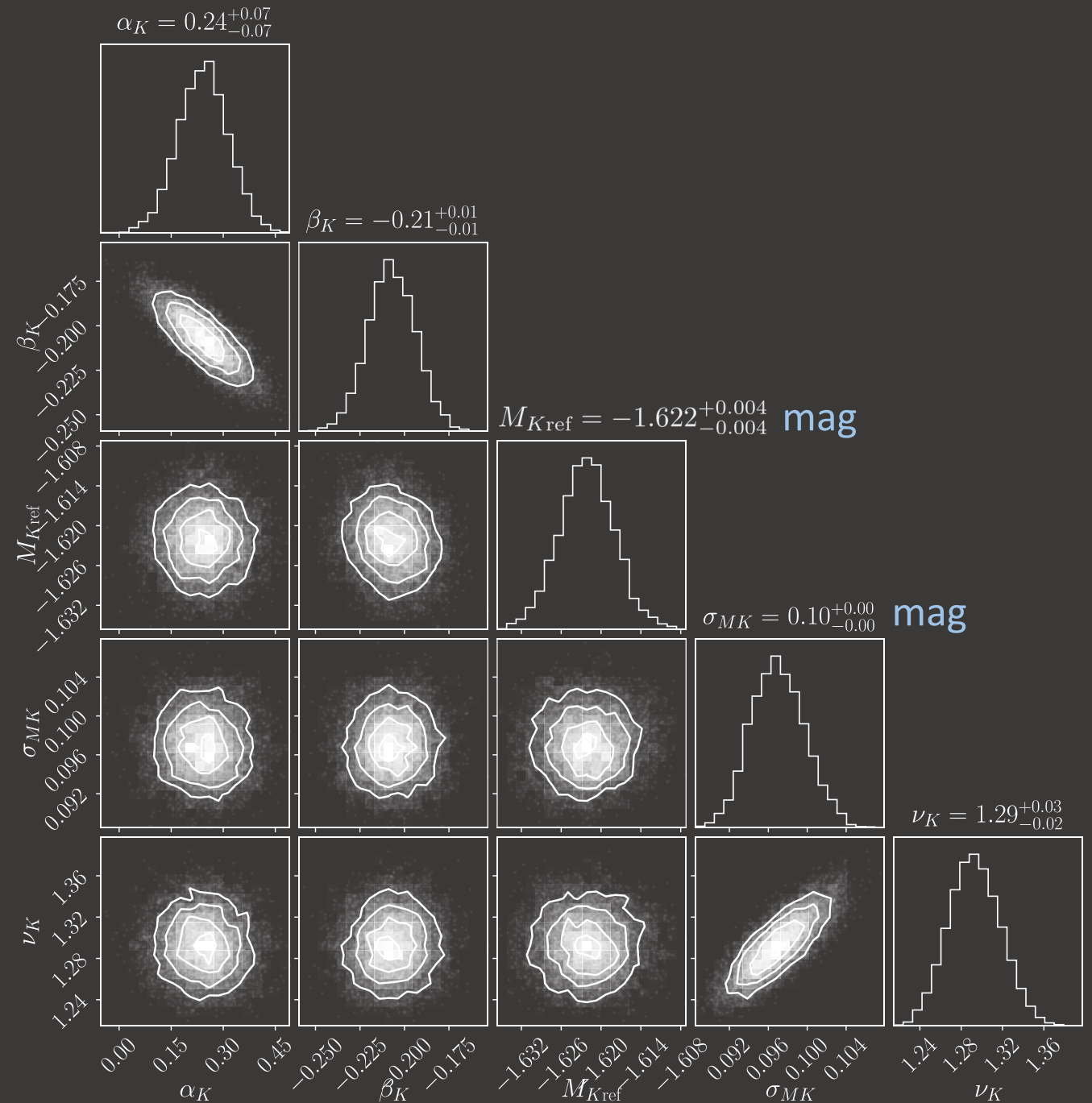
Photometry available:  
2MASS: JHK<sub>s</sub>  
*Gaia*: G



The zero-point offset is constrained to within  $\sim 1 \mu\text{as}$

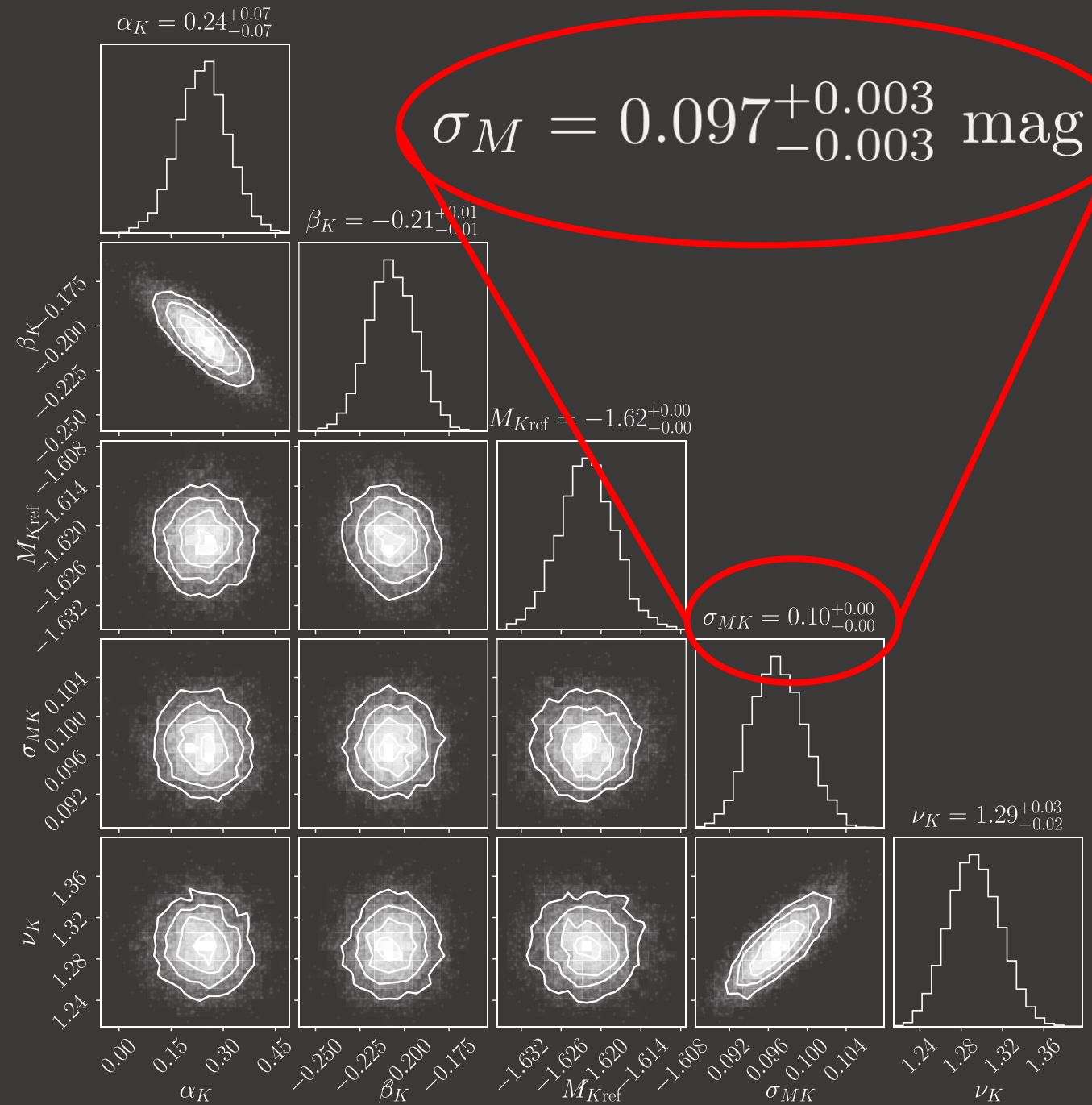


The red clump luminosity is inferred to have dependence on colour/metallicity



Model  
uncertainties  
outweigh  
photometric  
uncertainties

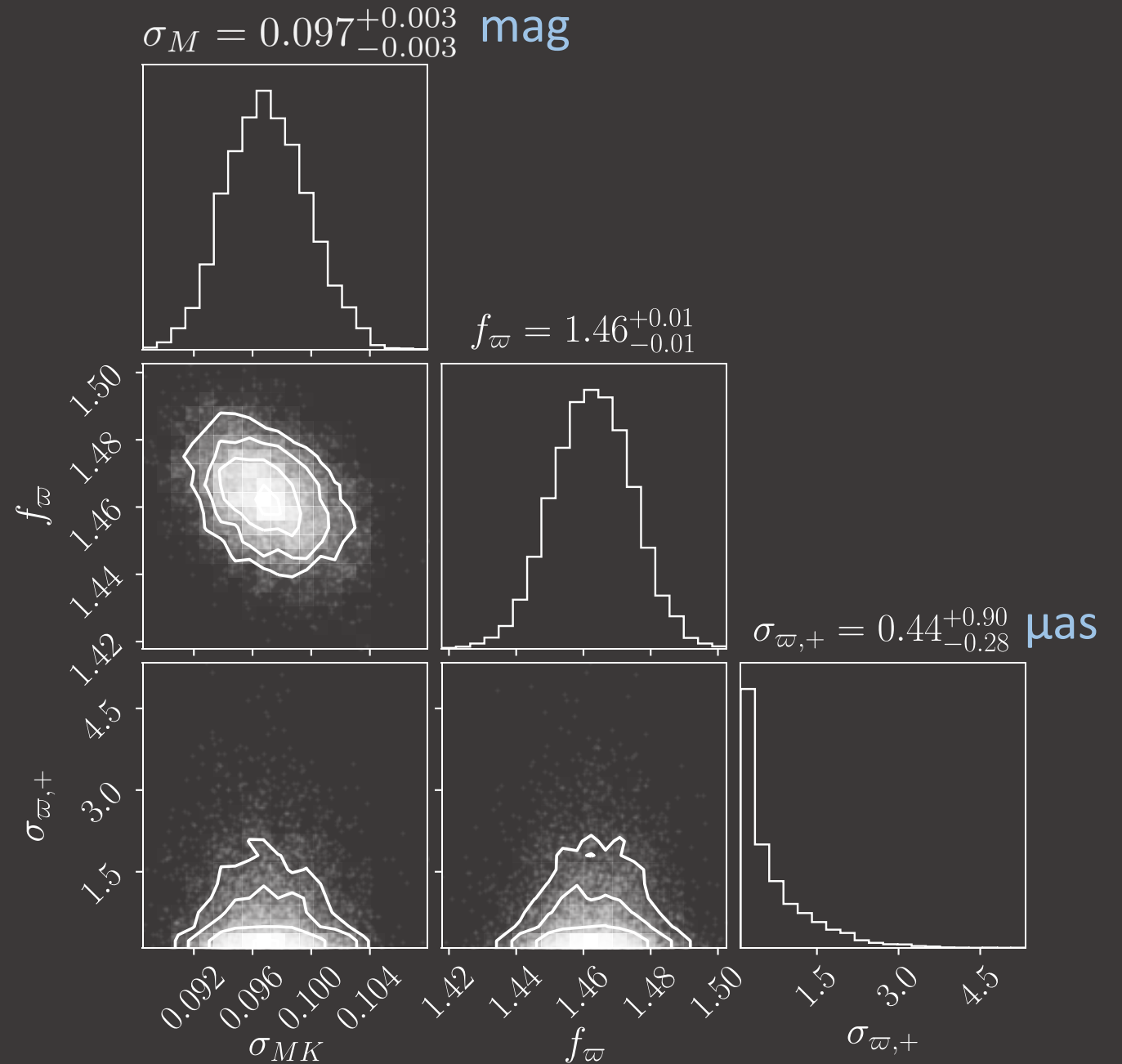
Typical  $K_s$  error  $\sim 0.02$  mag



*Gaia* parallax  
error correction  
in disagreement  
with tentative  
values

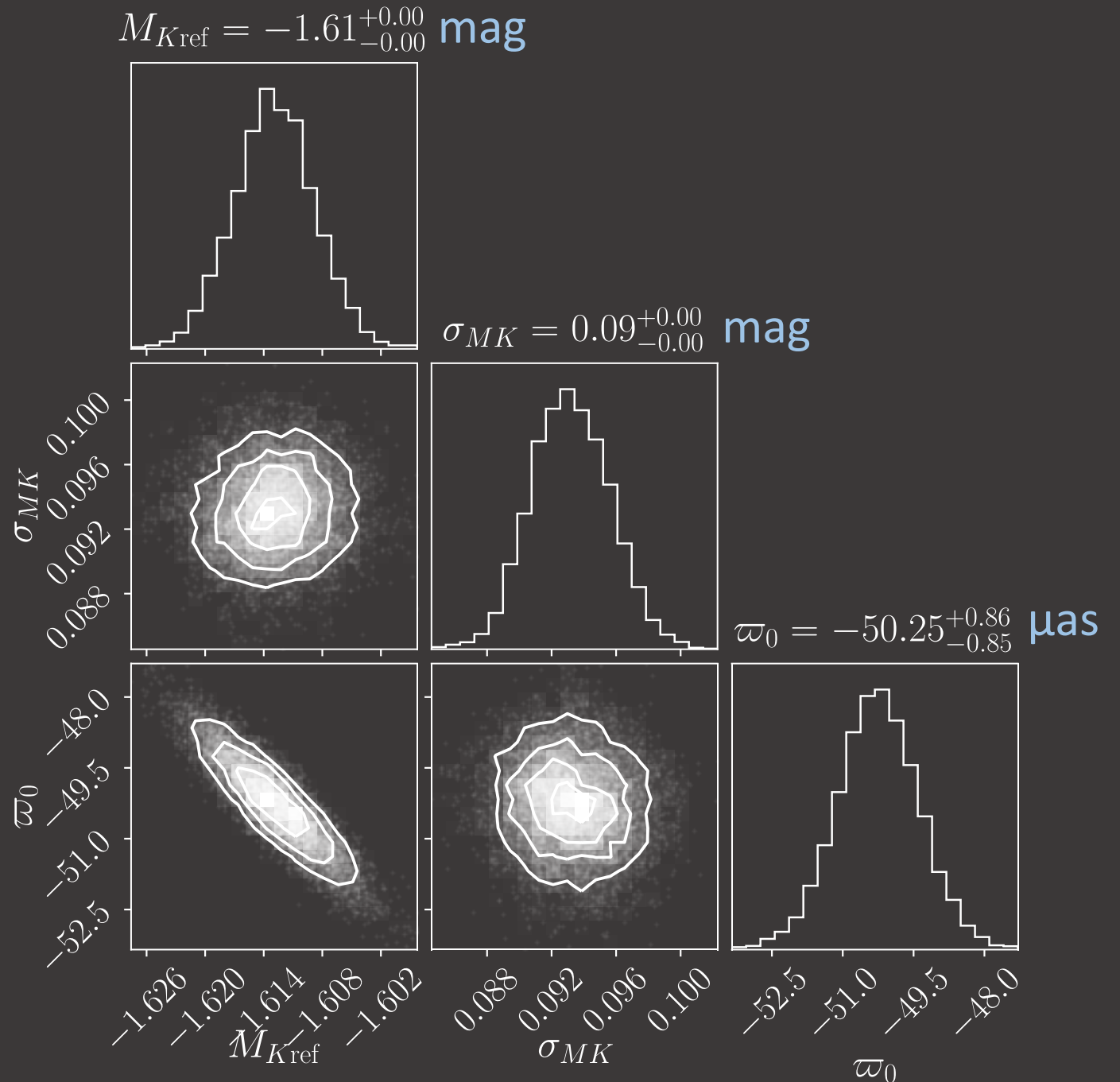
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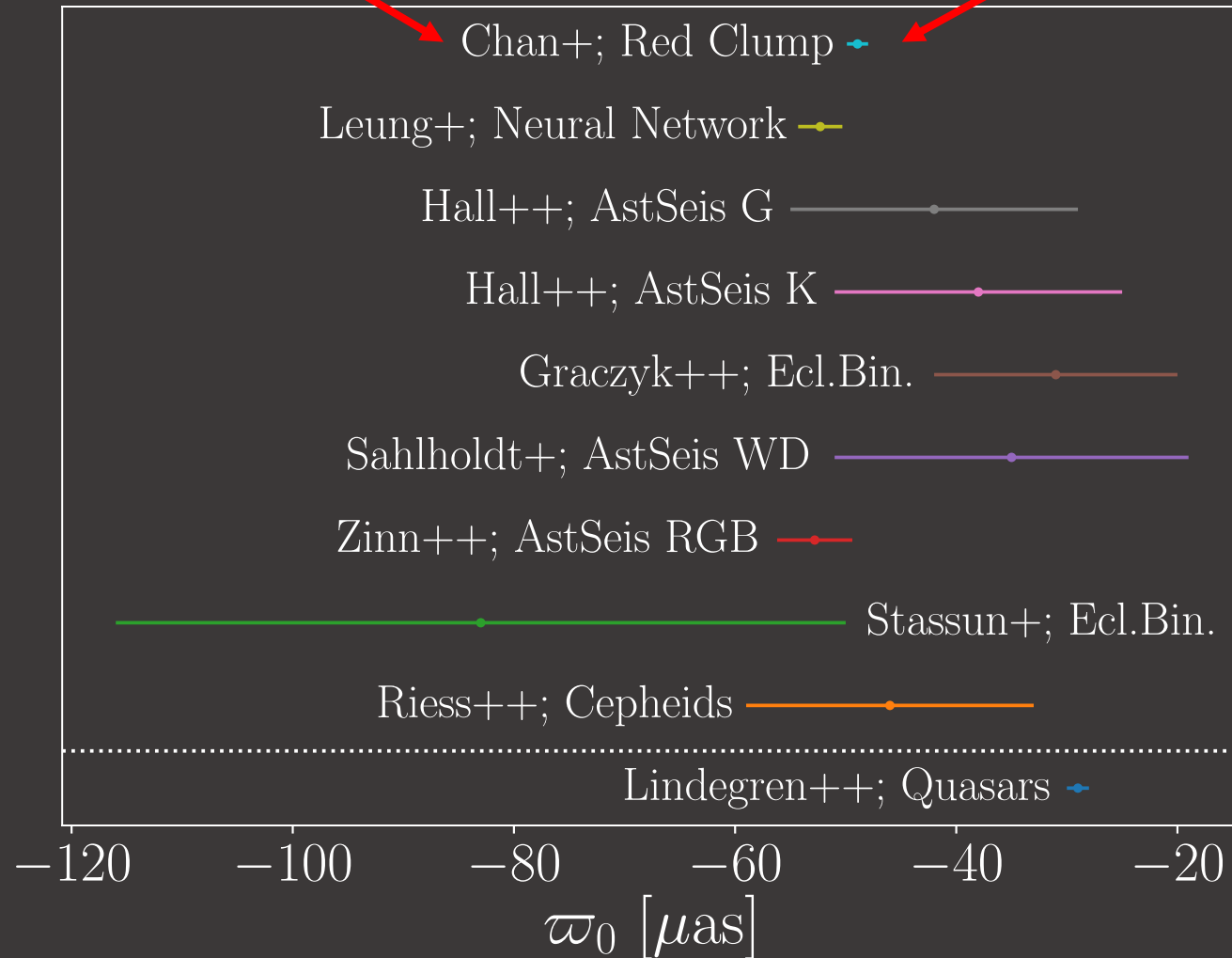


Fixing error  
correction to  
reported values  
changes results

$$f_{\varpi} = 1.08$$
$$\sigma_{\varpi,+} = 21 - 43 \mu\text{as}$$



# Constant zero-point results seem to agree with others





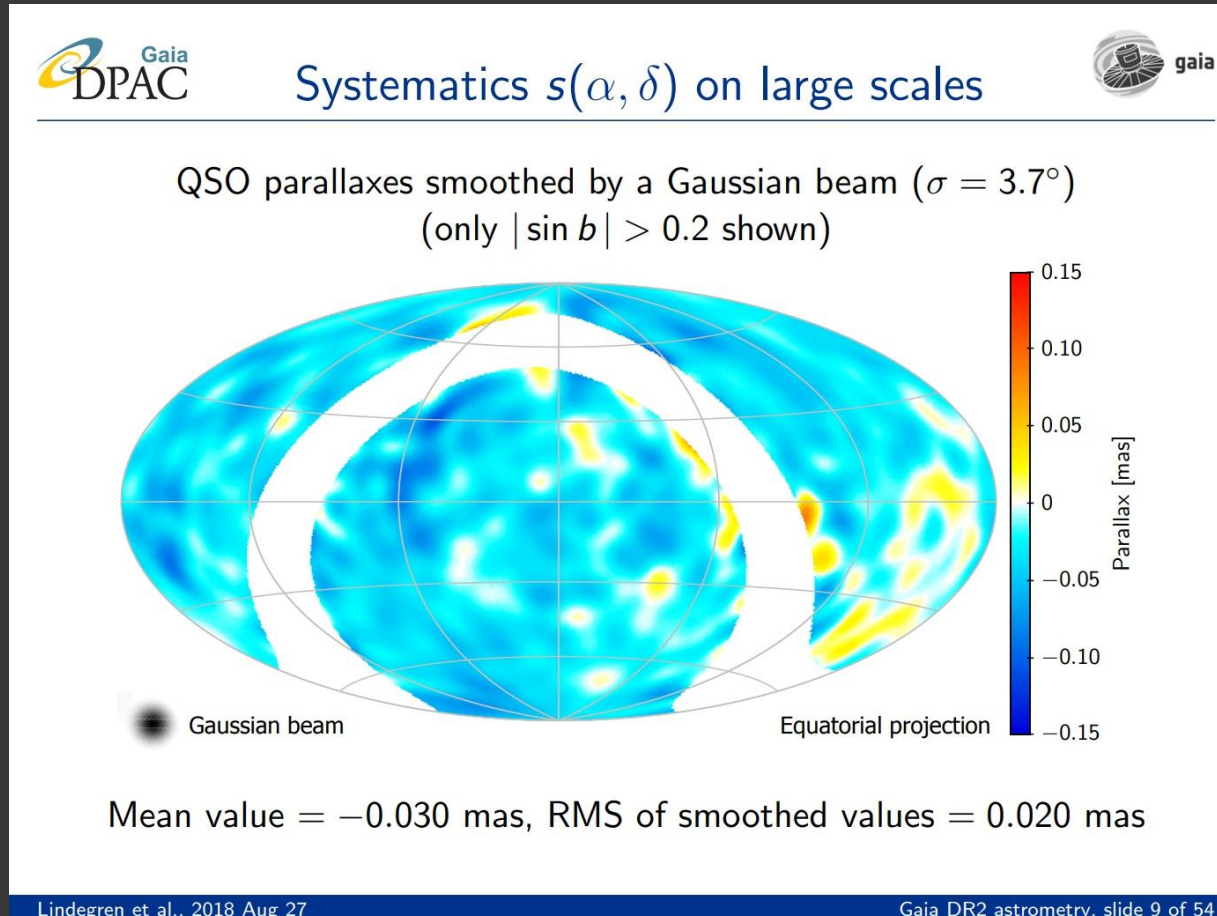
Adding zero-point dependences by including a functional form

$$\varpi_0 \sim z_0 + z_1 G + z_2 G^2 + \dots$$

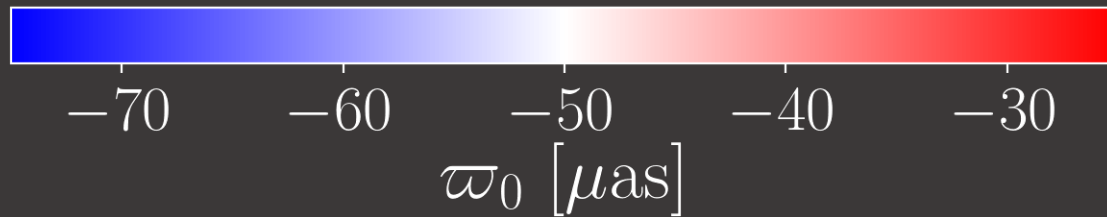
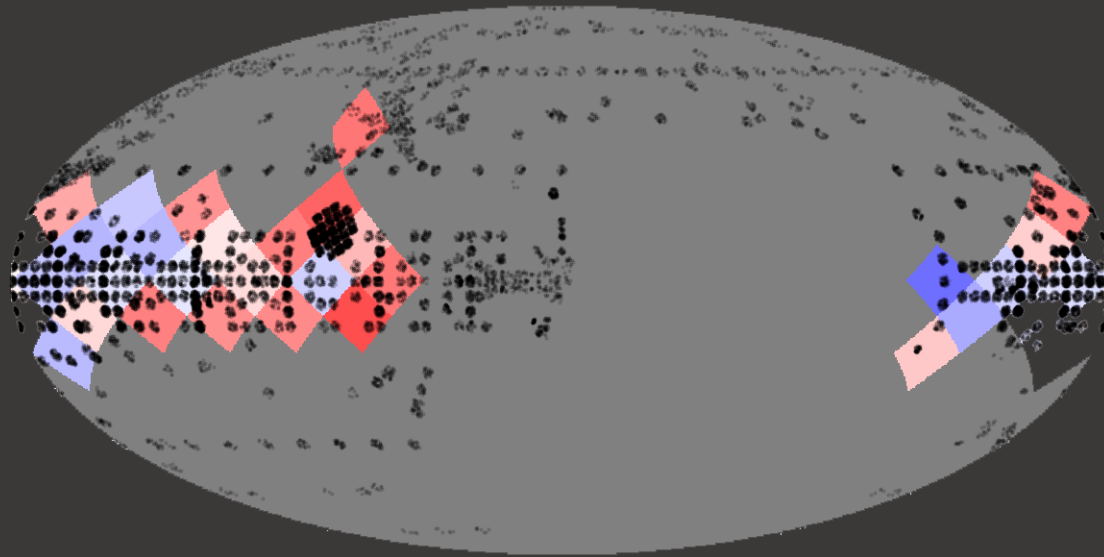
Parameters



# Reminder: The zero-point parallax may also vary across the sky

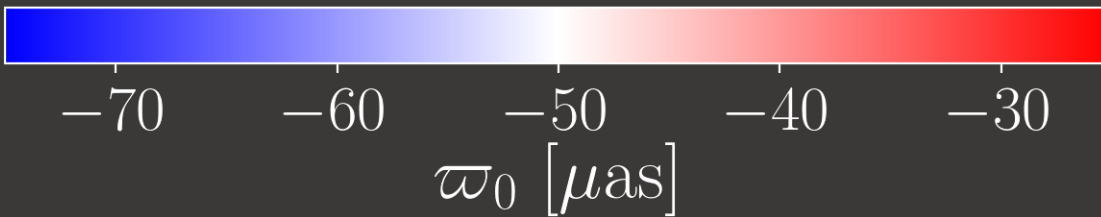
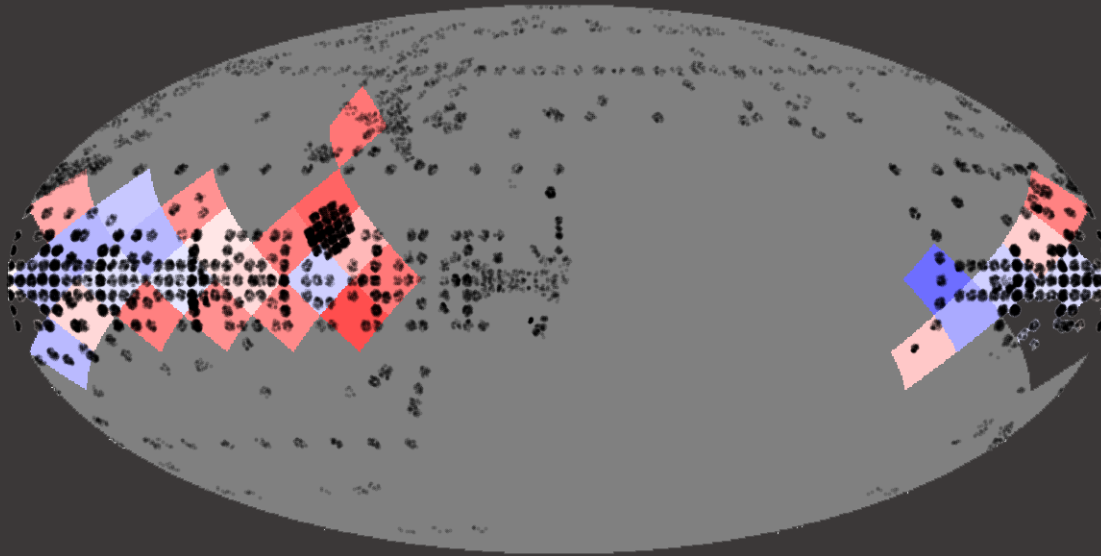


We can see variations across the MW disk



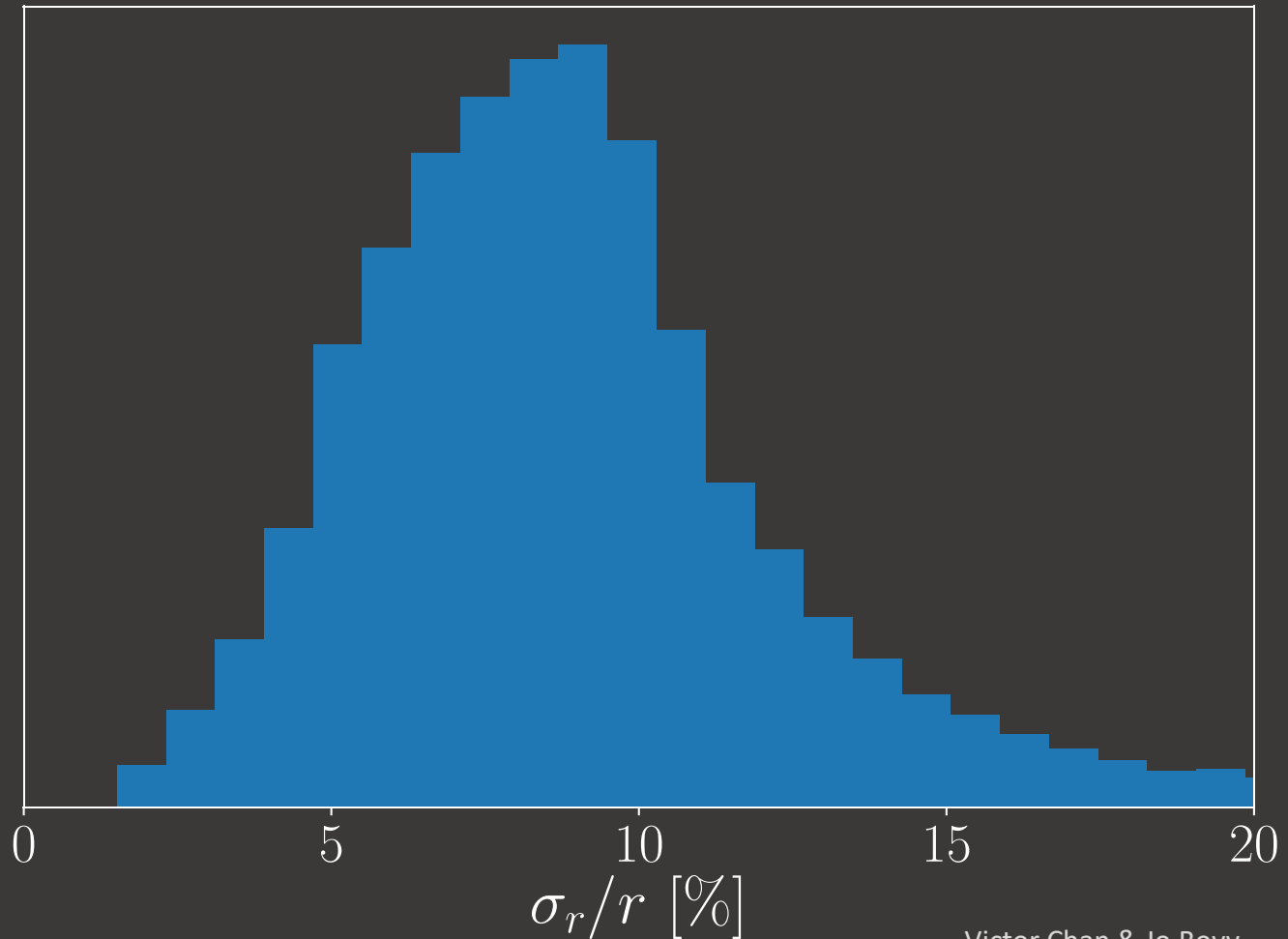
**PRELIMINARY!!!**

We can see variations across the MW disk

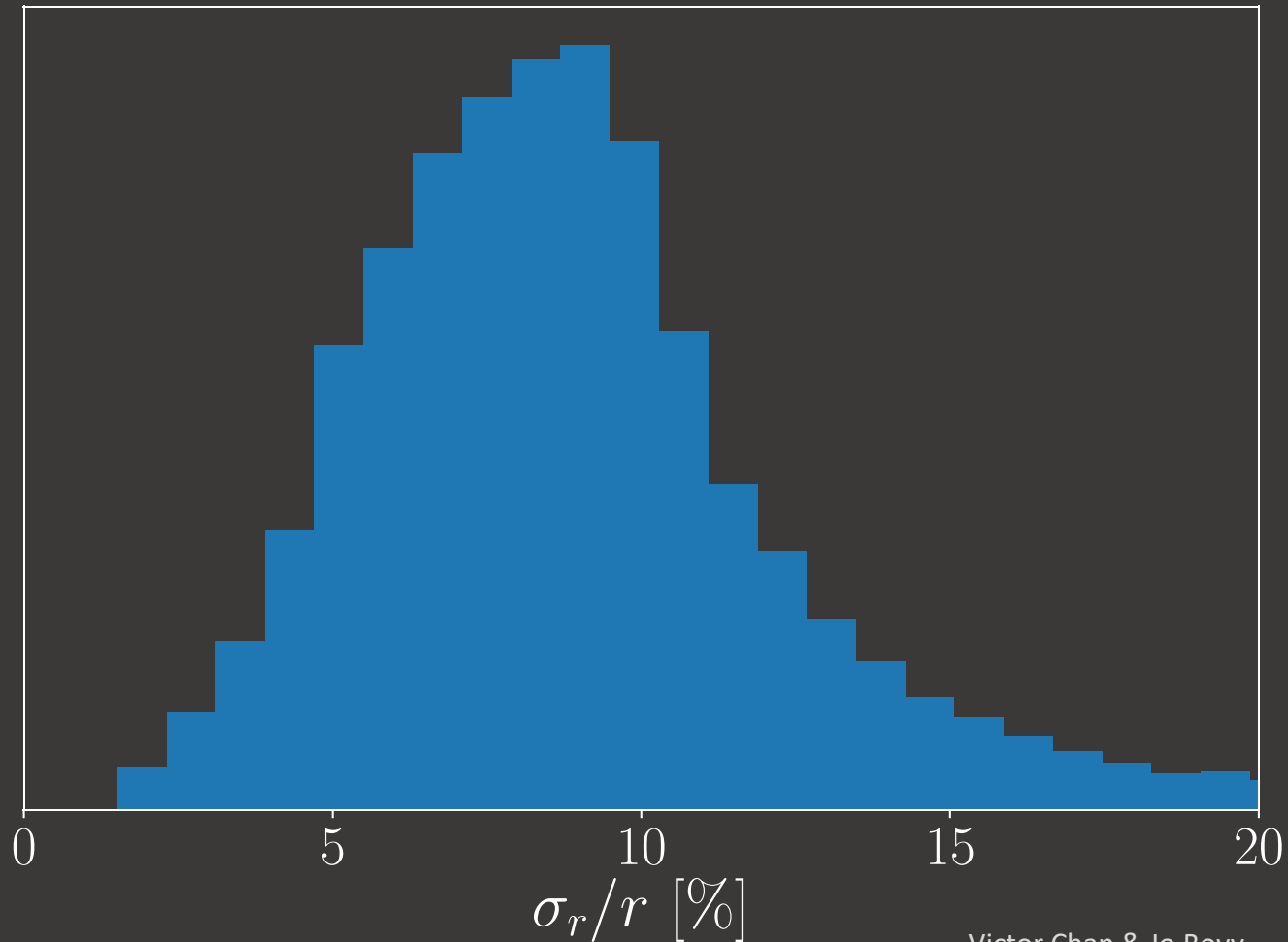


Even more sources  
coming in DR3 &  
future APOGEE data!

# Good distance anchors improve our understanding of local $H_0$ measurements

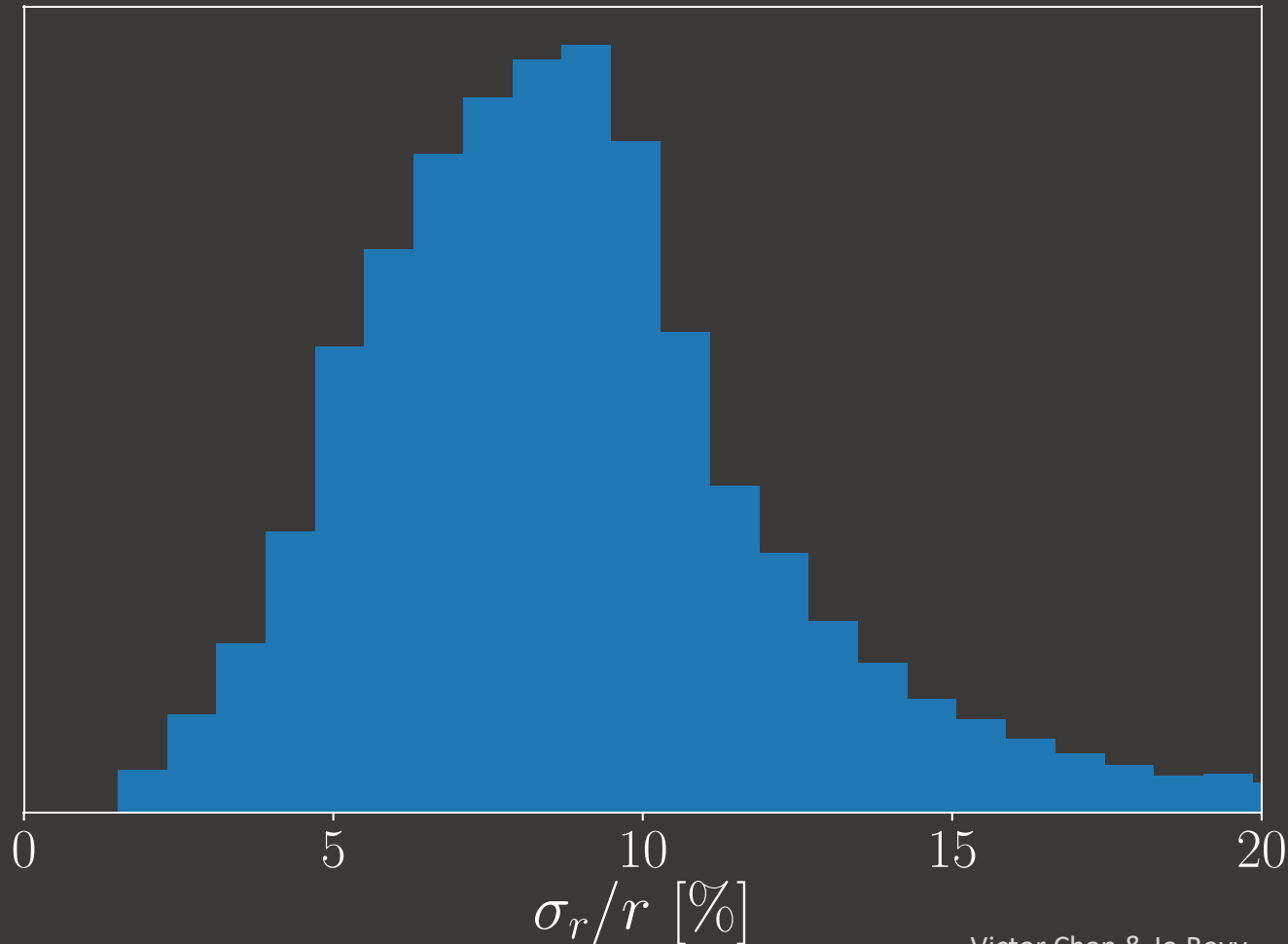


# Good distance anchors improve our understanding of local $H_0$ measurements



$$\sigma_{\varpi_0} < 1 \mu\text{as}$$

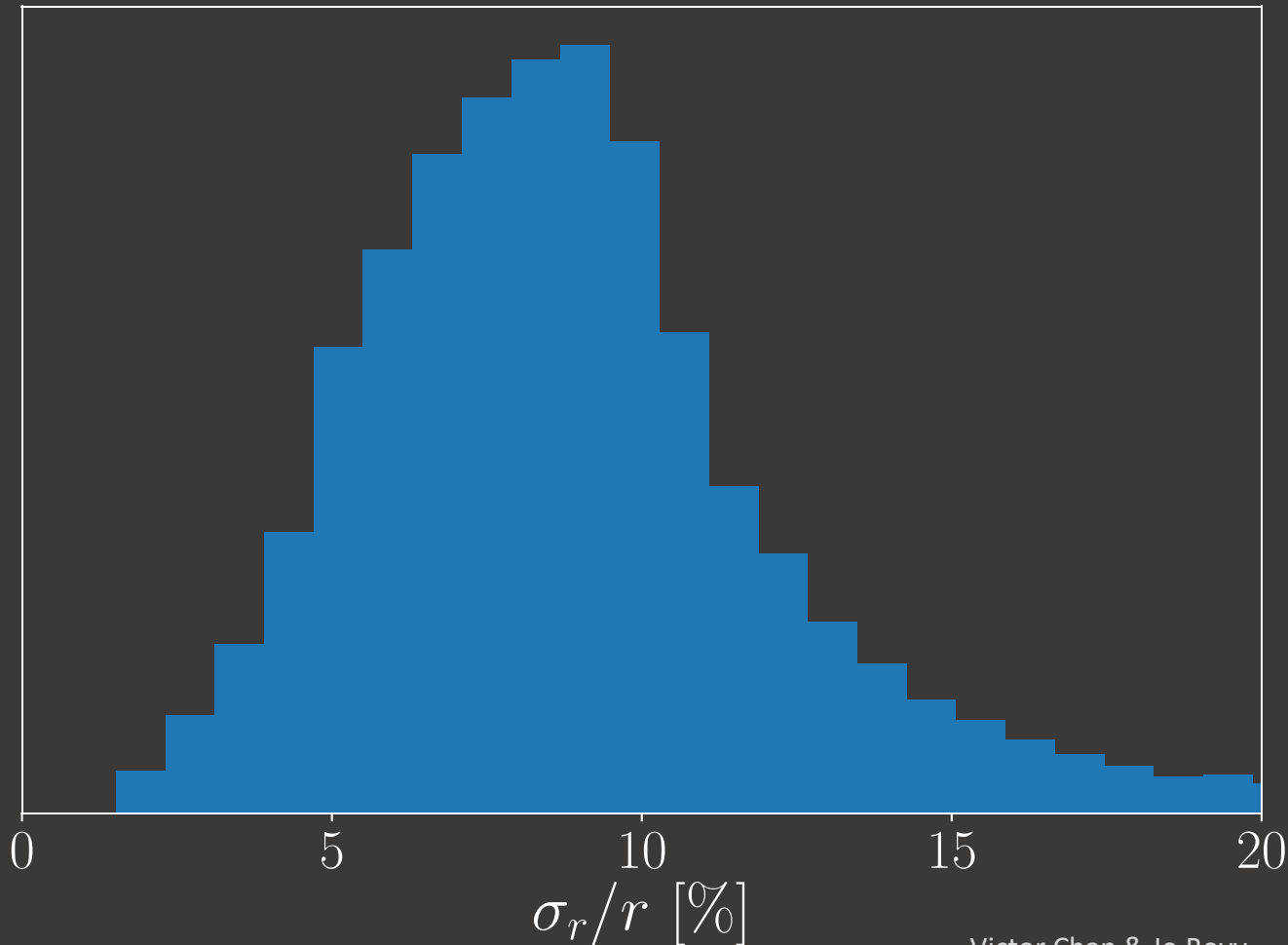
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$$N \approx 28000$$

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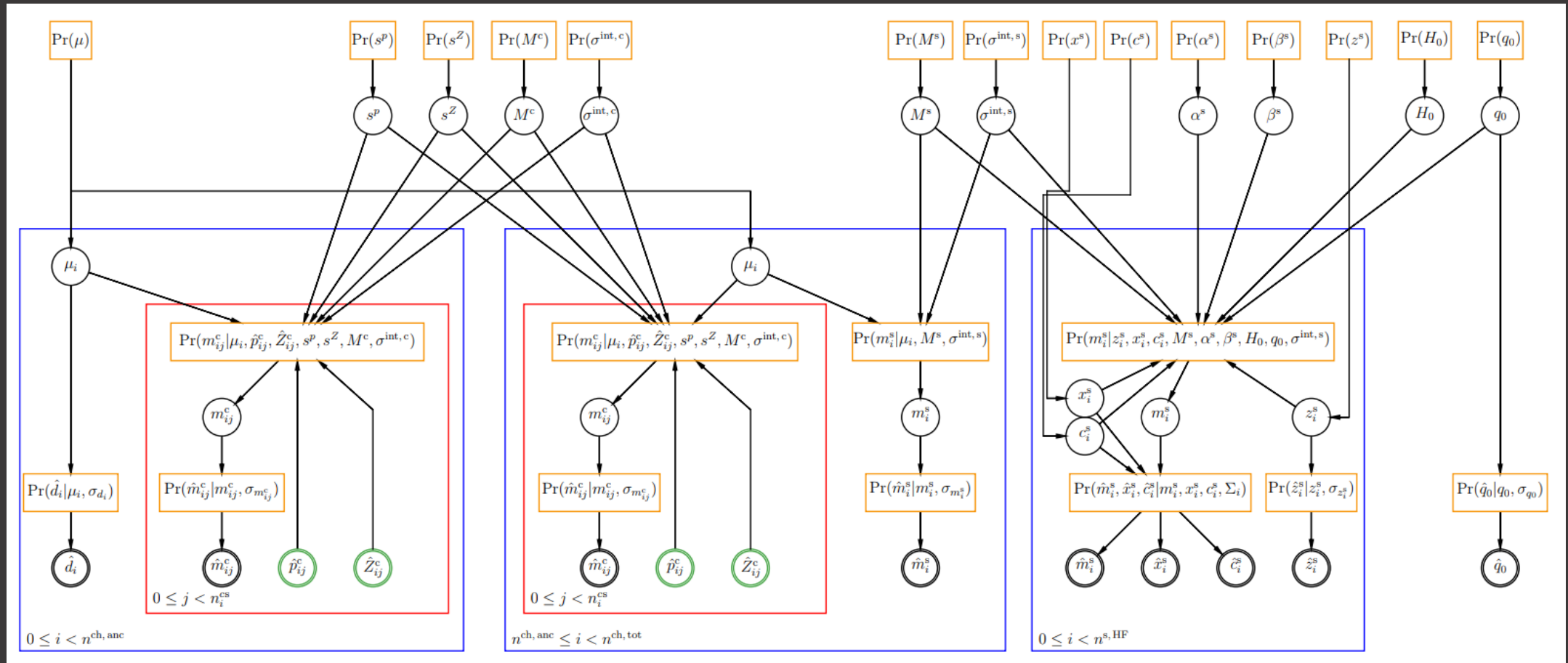
$$\sigma_{\varpi_0} < 1 \mu\text{as}$$

$$N \approx 28000$$

$$\frac{10\%}{\sqrt{N}} \ll 1\%$$



# The probabilistic model can be adapted to a full Hubble parameter inference





Zero-point expected in Data Release 3 as well

*More accurate astrometry*

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*Larger datasets*

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**Deeper/Dimmer sources**

**Larger datasets**

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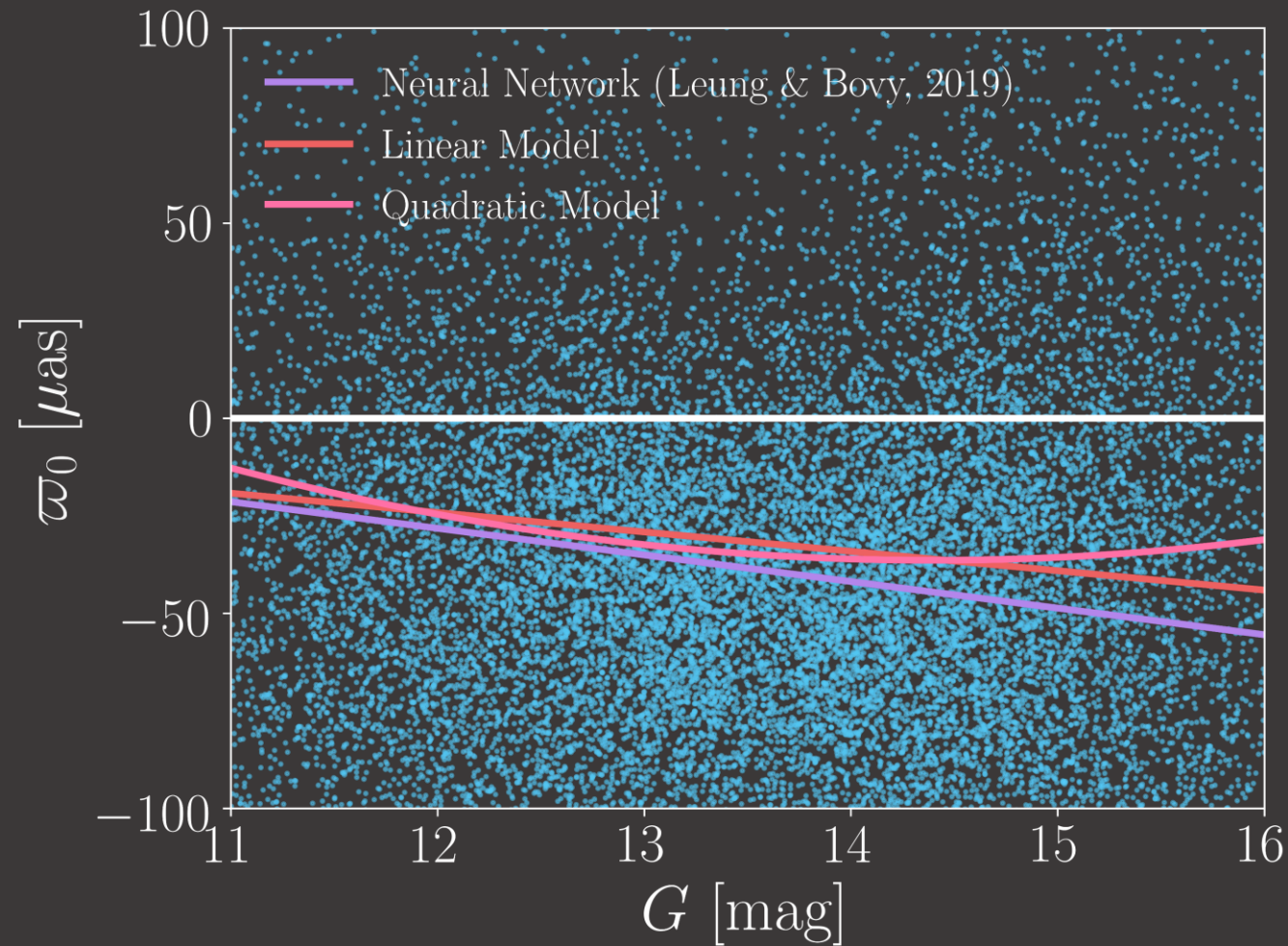
More accurate astrometry

Spectra

## In summary...

- *Gaia* has the potential to greatly improve local  $H_0$  measurements
- We infer a zero-point parallax of  $-48.9 \pm 0.9 \mu\text{as}$  if constant
  - Most precise to date
- Magnitude, colour, and sky position dependence can be included
- Probabilistic model can be extended to a full  $H_0$  inference

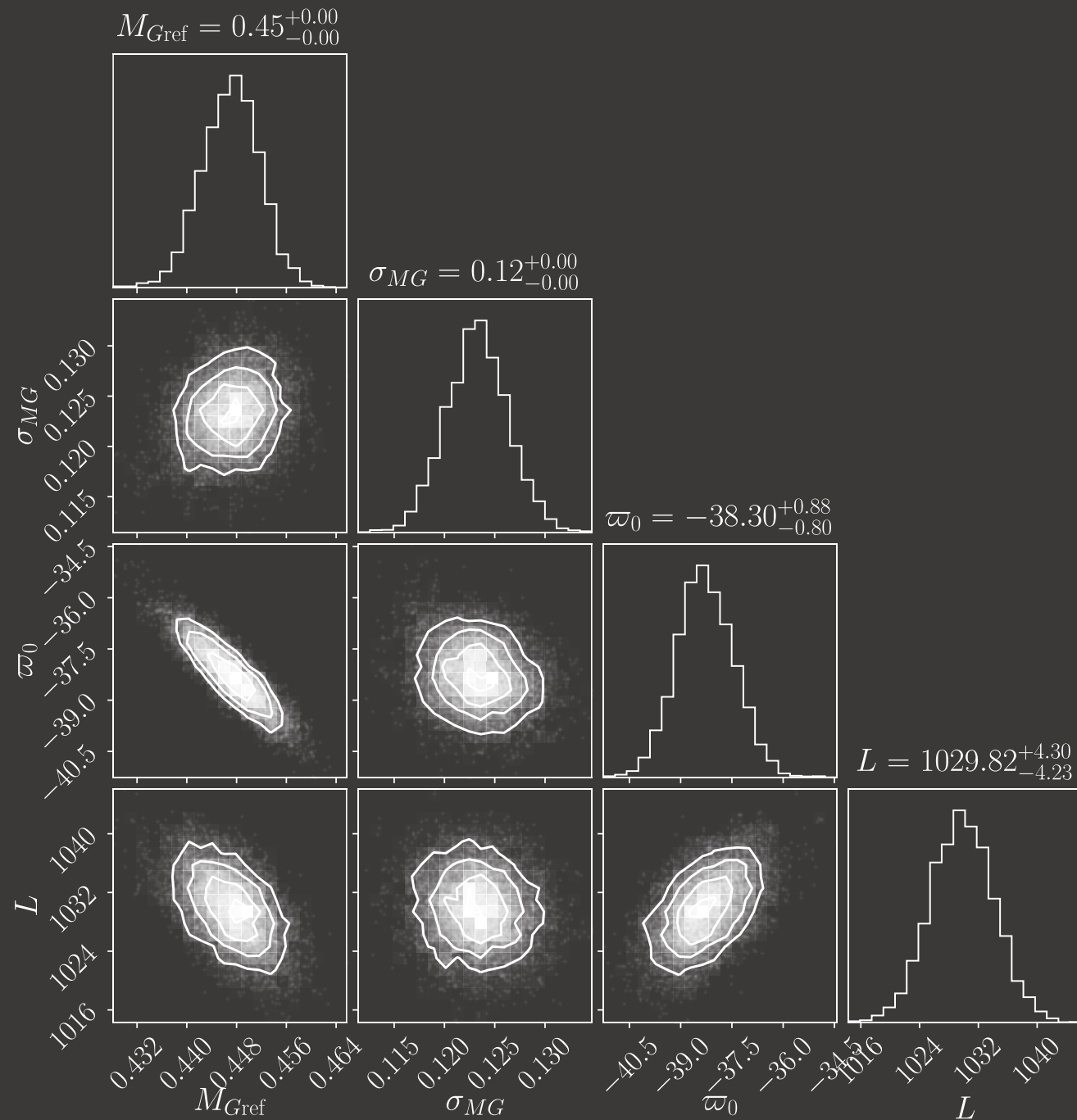
# The zero-point parallax appears to be more significant for dim sources



Preliminary!!!



# G band photometric inference



Multiple photometric measurements can be used simultaneously

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Analogous to covariance matrix

The combined photometry model favours  $K_s$  band results

