



# CEPHEIDS AND OTHER STELLAR POPULATIONS

LUCAS MACRI

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FOR FUNDAMENTAL PHYSICS & ASTRONOMY

DEPARTMENT OF PHYSICS & ASTRONOMY

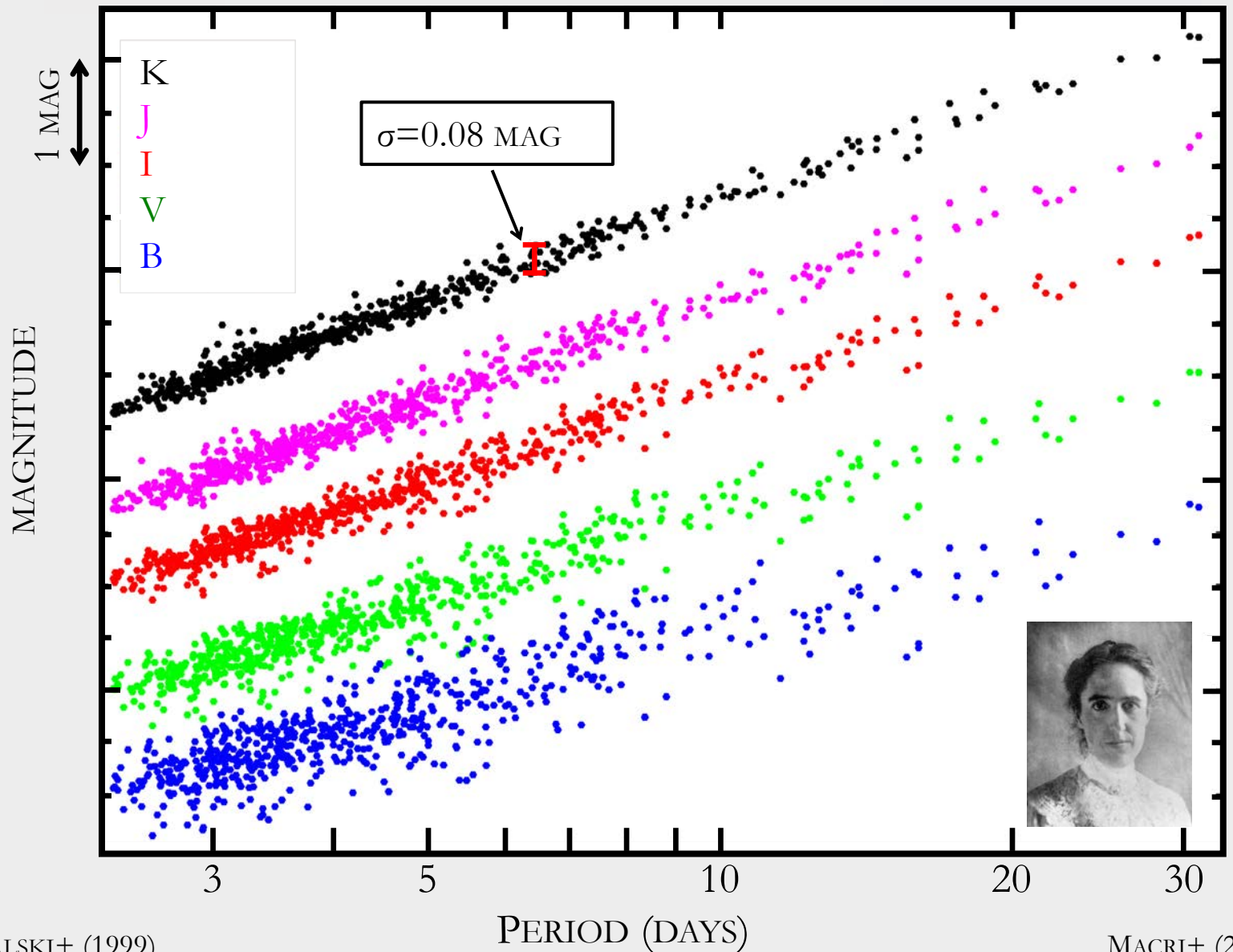
COLLEGE OF SCIENCE

TEXAS A&M UNIVERSITY

# ADVANTAGES OF SHOES CEPHEIDS

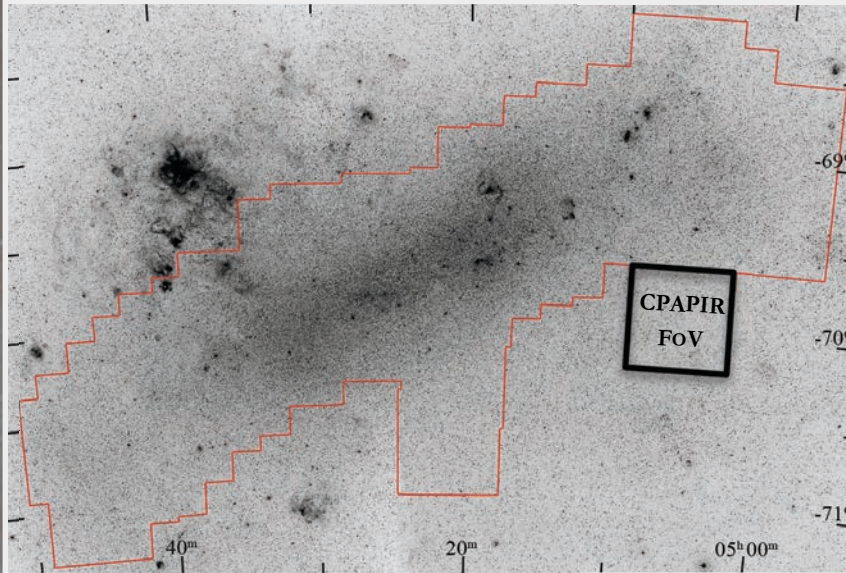
- 3 independent absolute calibrations:
  - 50+ Milky Way parallaxes (*Hipparcos*, HST/FGS, HST/WFC3)
  - Maser distance to NGC 4258 (today's talk by Mark Reid)
  - Detached eclipsing binaries in the LMC (Pietrzynski+18)
- Primary measurements made at H-band ( $1.6\mu\text{m}$ )
  - Impact of dust reduced by  $>3\times$  relative to I-band
  - Used in reddening-free Wesenheit index (Madore 1982)
  - Minimal sensitivity to metallicity (Wielgorski+ 2017)
  - No Ceph.-SN residuals vs. distance: crowding under control
- Matrix-based formalism
  - Allows unbiased quantification of “analysis systematics”

# LEAVITT LAWS IN THE LMC

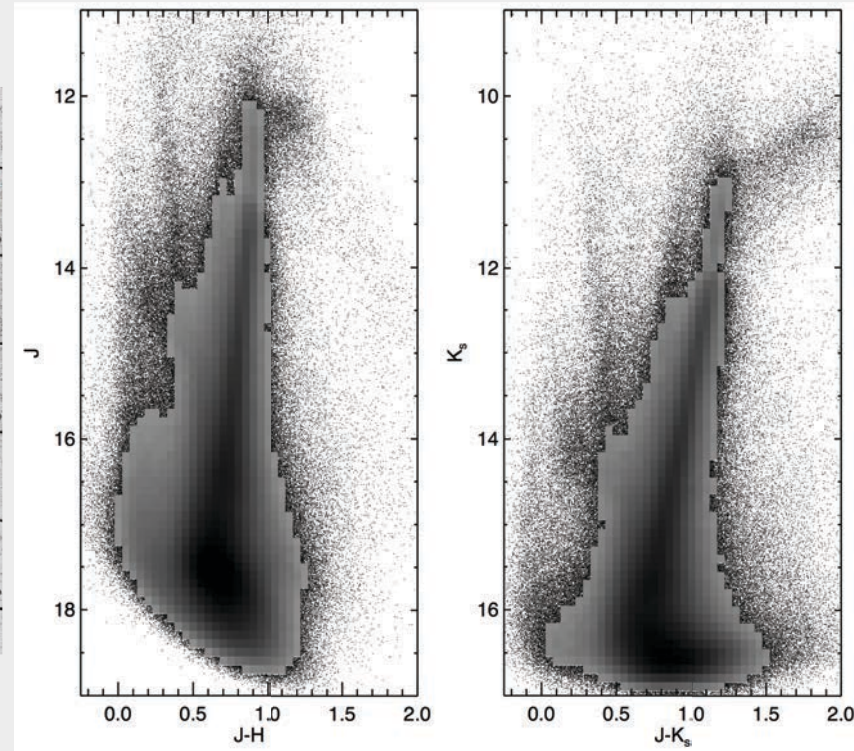


# SH0ES ANCHOR #2 OF 5: LMC

- CTIO 1.5-m, 18 sq deg synoptic survey (Macri+ 2015)
  - >1400 OGLE Cepheids,  $P=2-100d$ , tied to 2MASS
  - **70  $P\sim 6-60d$  observed with HST/WFC3**
- 1.1% DEB distance (Pietrzynski+ 2018)
- Fully-propagated uncertainty:  $\sigma(\text{anchor})=1.3\%$

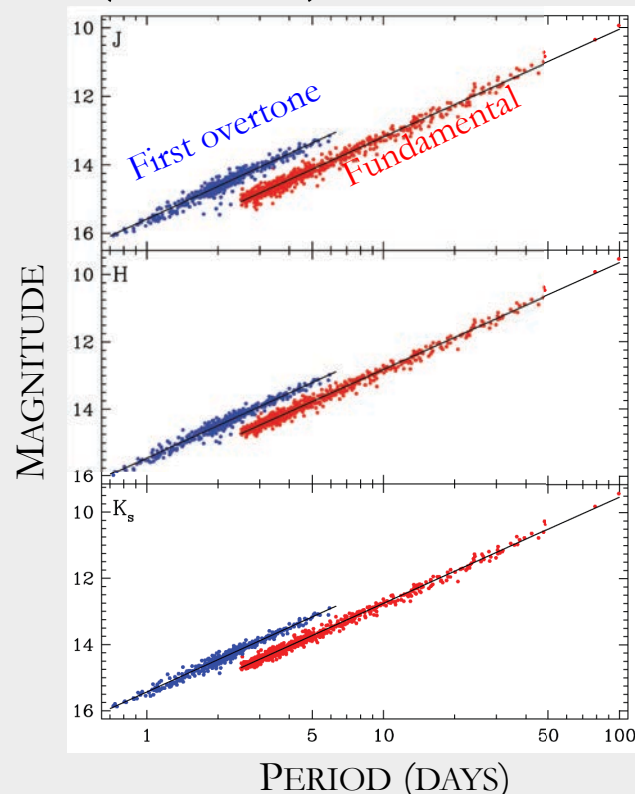
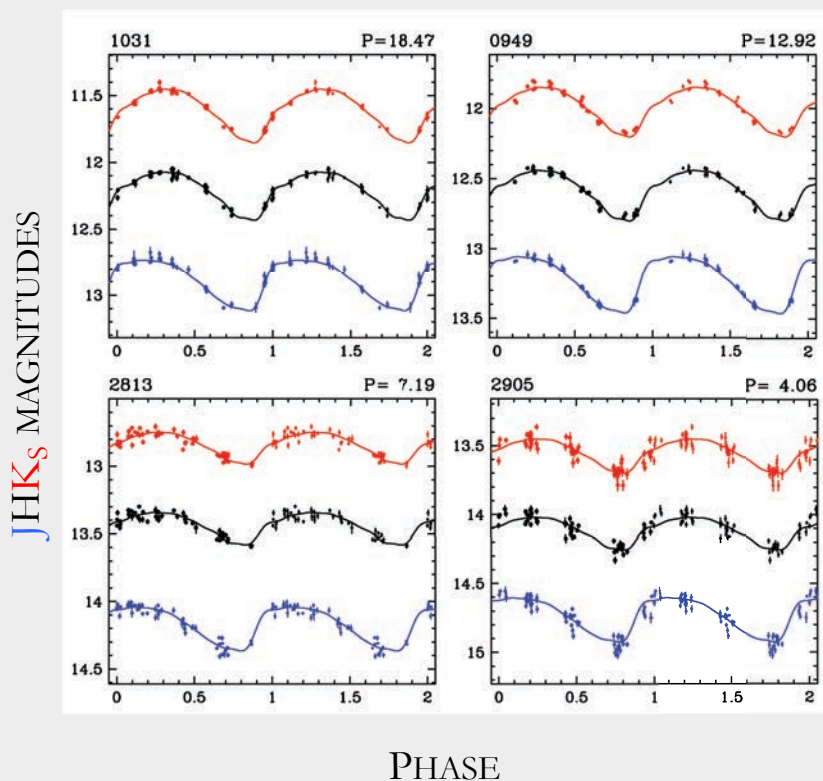


MACRI+ (2015)

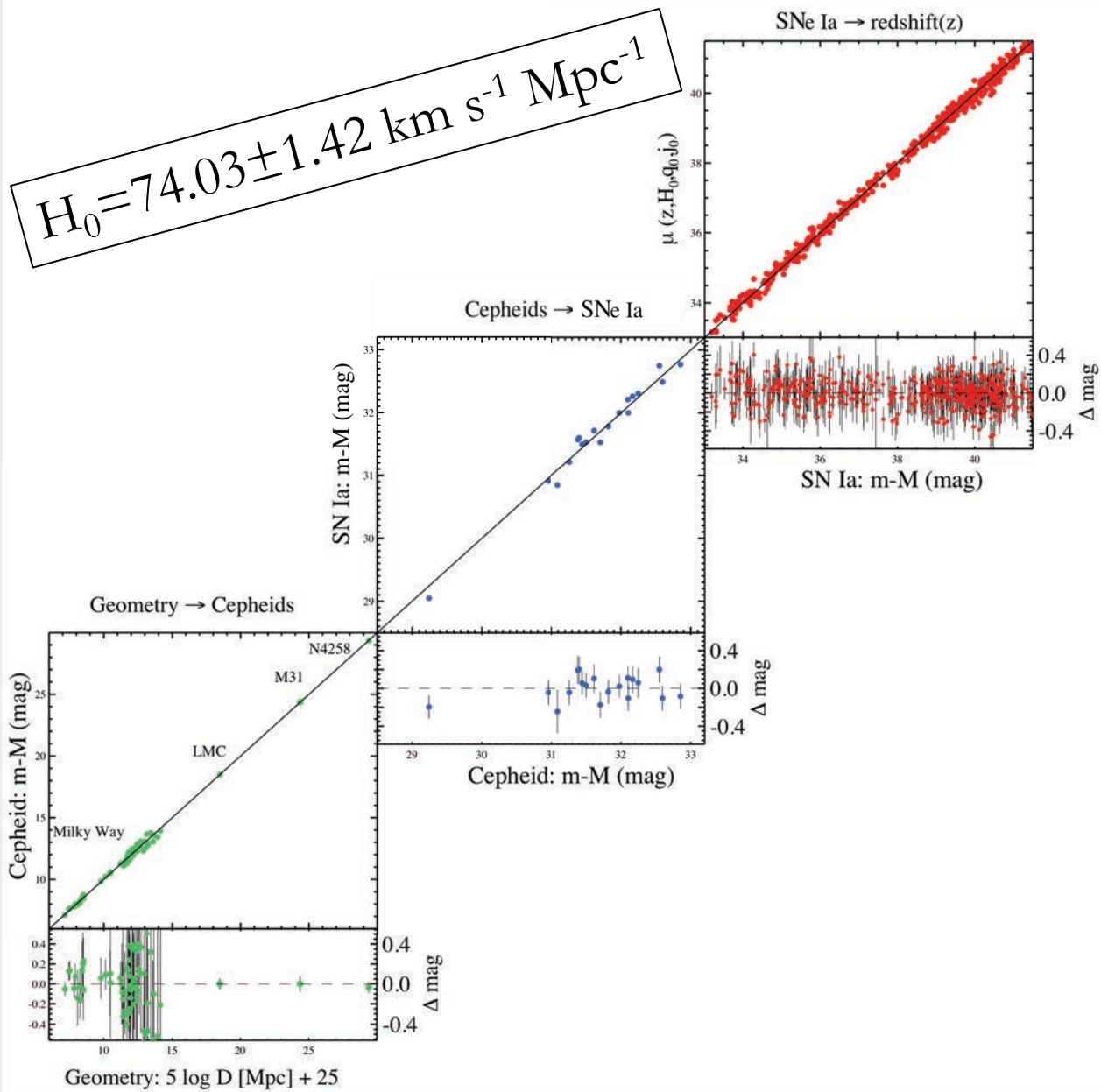


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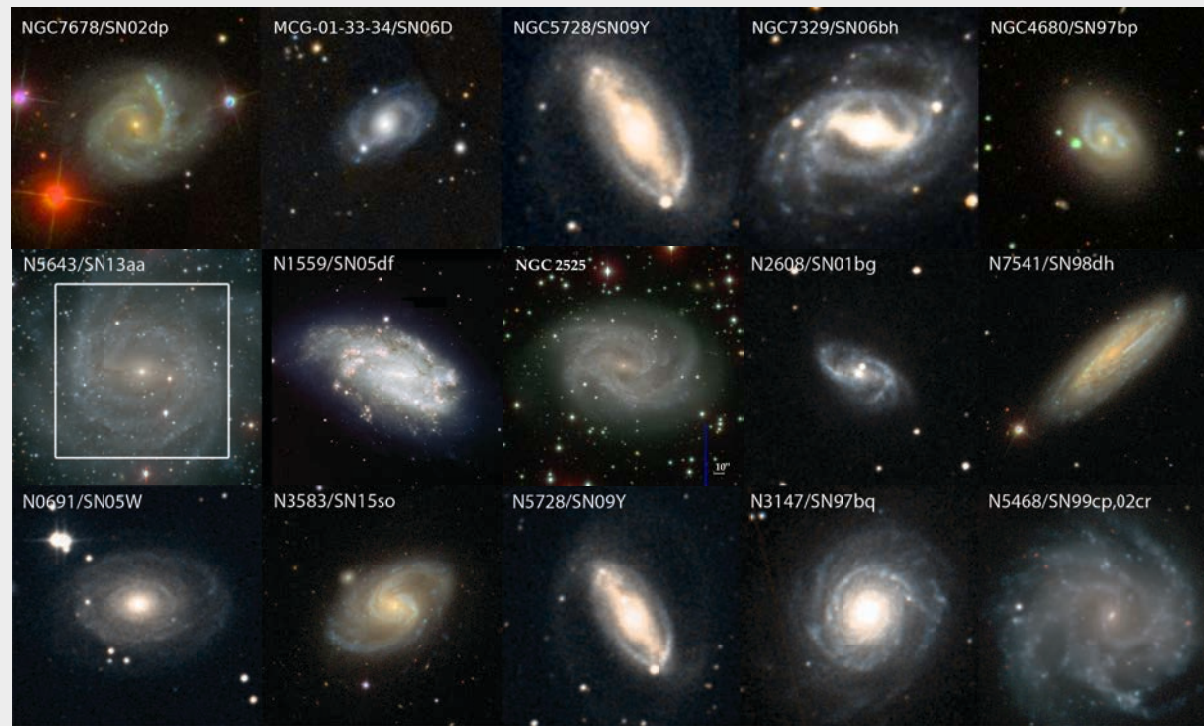


# SH<sub>0</sub>ES DISTANCE LADDER



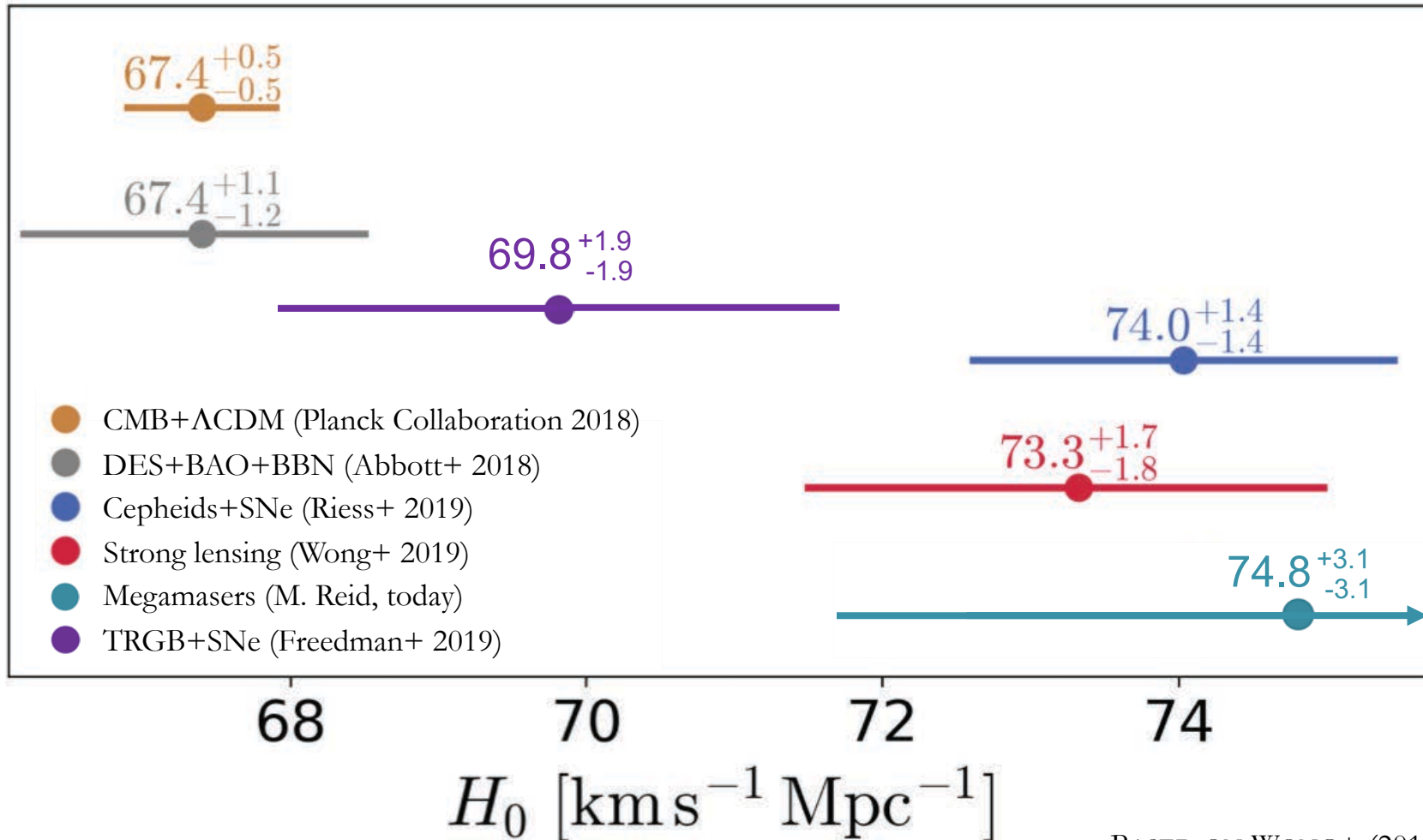
# HST CYCLES 25 & 26

- Cepheid search in 15 additional hosts of SNe Ia
  - Increase calibrator sample to 38; should yield  $\sigma(H_0)=1.6\%$
- Mira search in nearest 4 of those hosts
  - Consistency check of Cepheid Distance Scale



# INDEPENDENT $H_0$ ESTIMATES

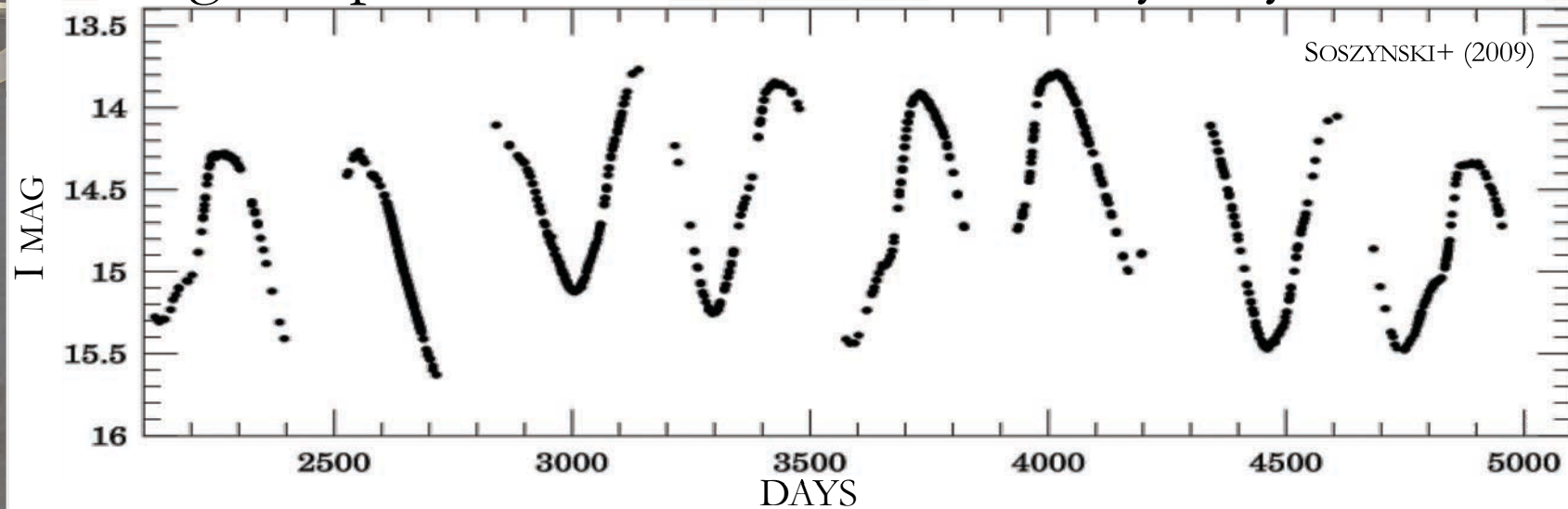
flat  $\Lambda$ CDM



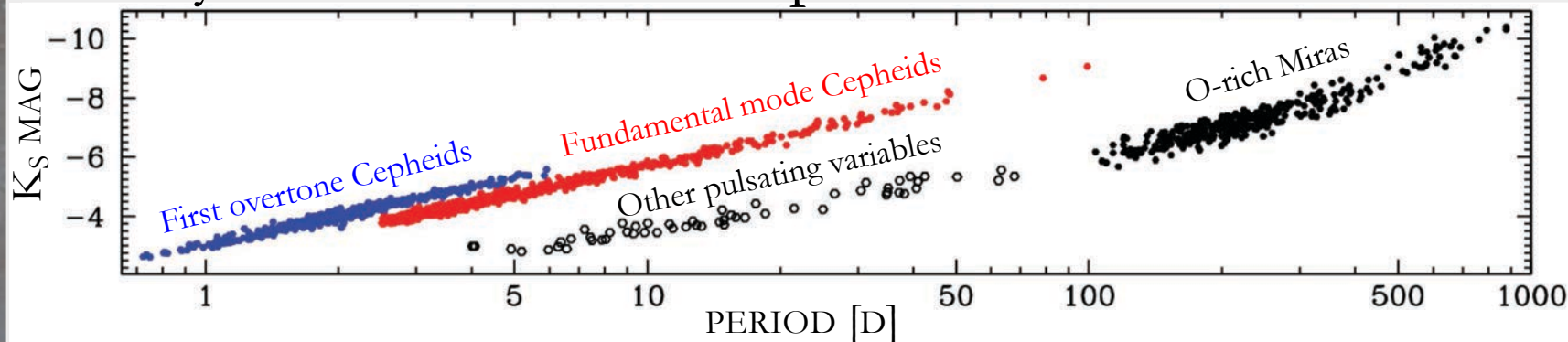


# WHY MIRAS?

- Plentiful in all galaxies → go beyond face-on spirals
- Large amplitudes in I-band → relatively easy to detect



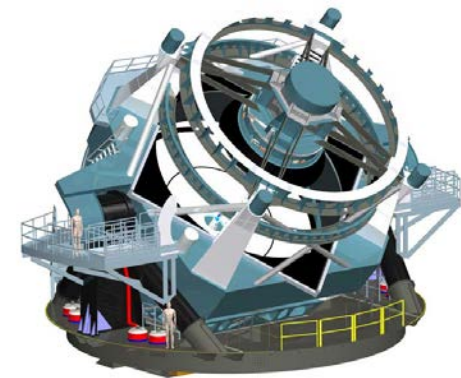
- Very luminous in NIR → powerful distance indicator





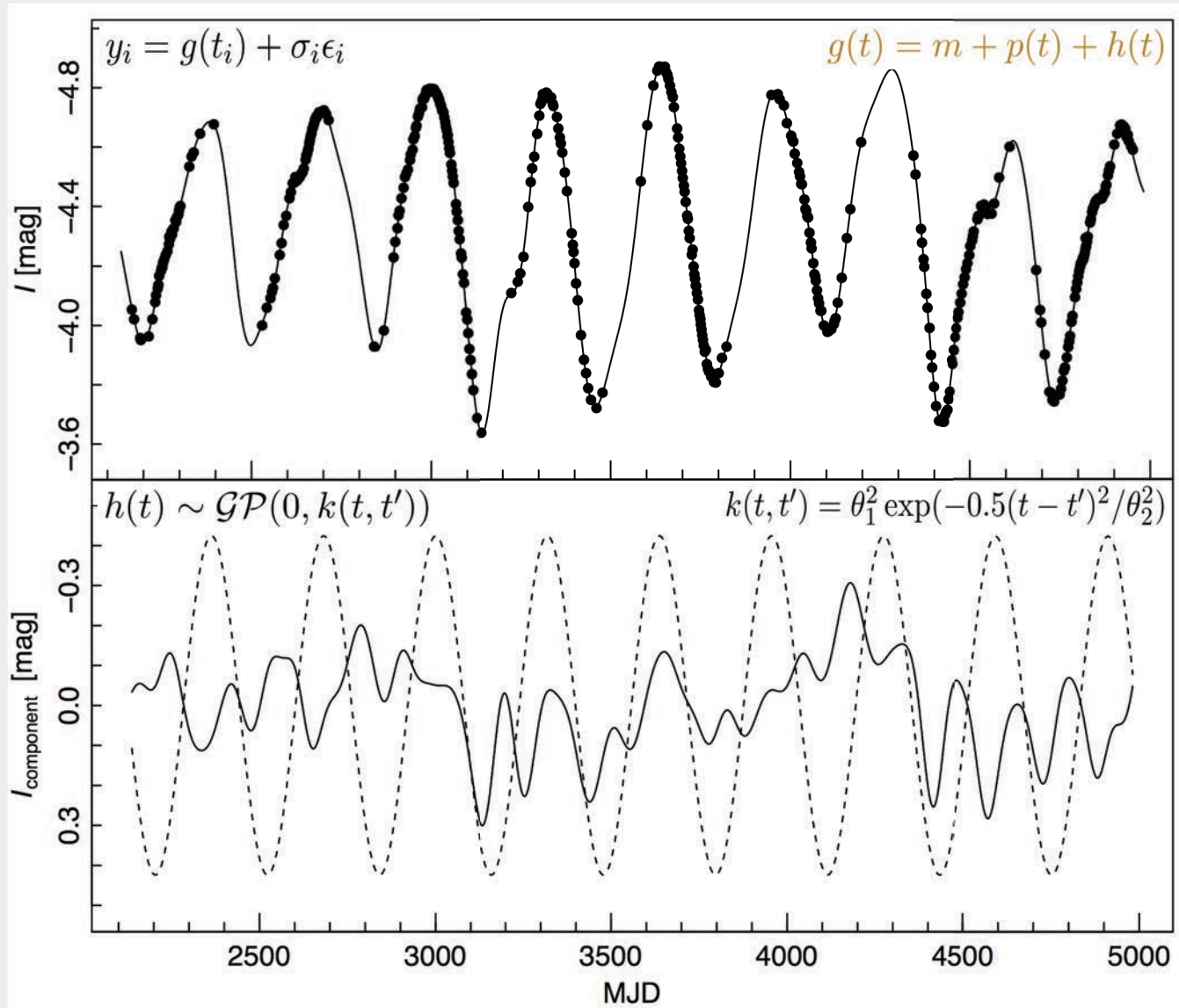
# WHY MIRAS?

- LSST will be sensitive enough to detect over  $10^5$  Miras in  $\sim 200$  galaxies with  $D < 15$  Mpc
- How to detect periodic but irregular variables using sparsely-sampled light curves?
- Develop & test novel periodogram technique with existing high-cadence observations (OGLE)
- Apply to sparser observations of M33 (Pellerin & Macri 2011)



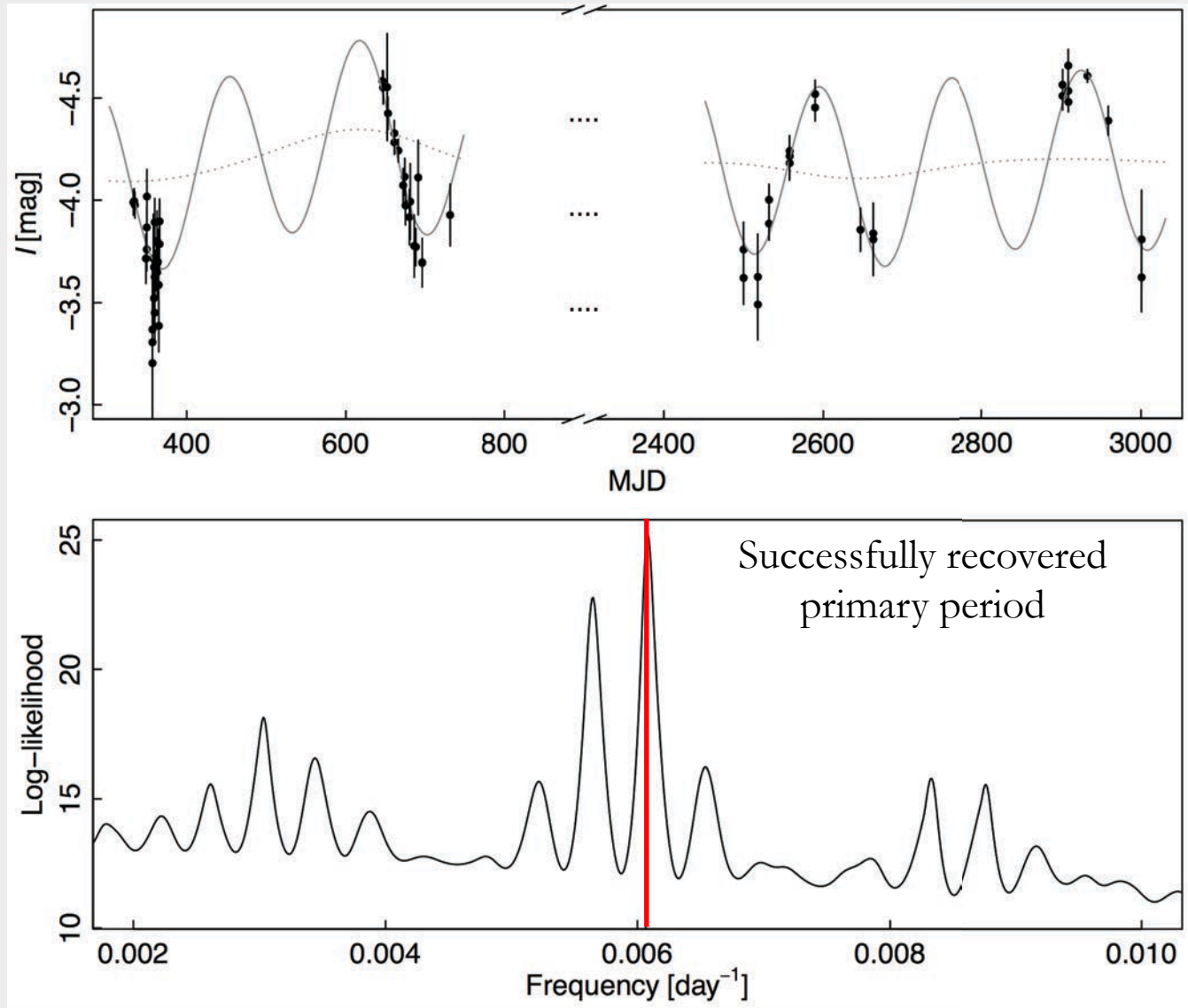
# GAUSSIAN PROCESS PERIODOGRAM

## DECOMPOSITION OF MIRA LIGHT CURVE (OGLE LMC)



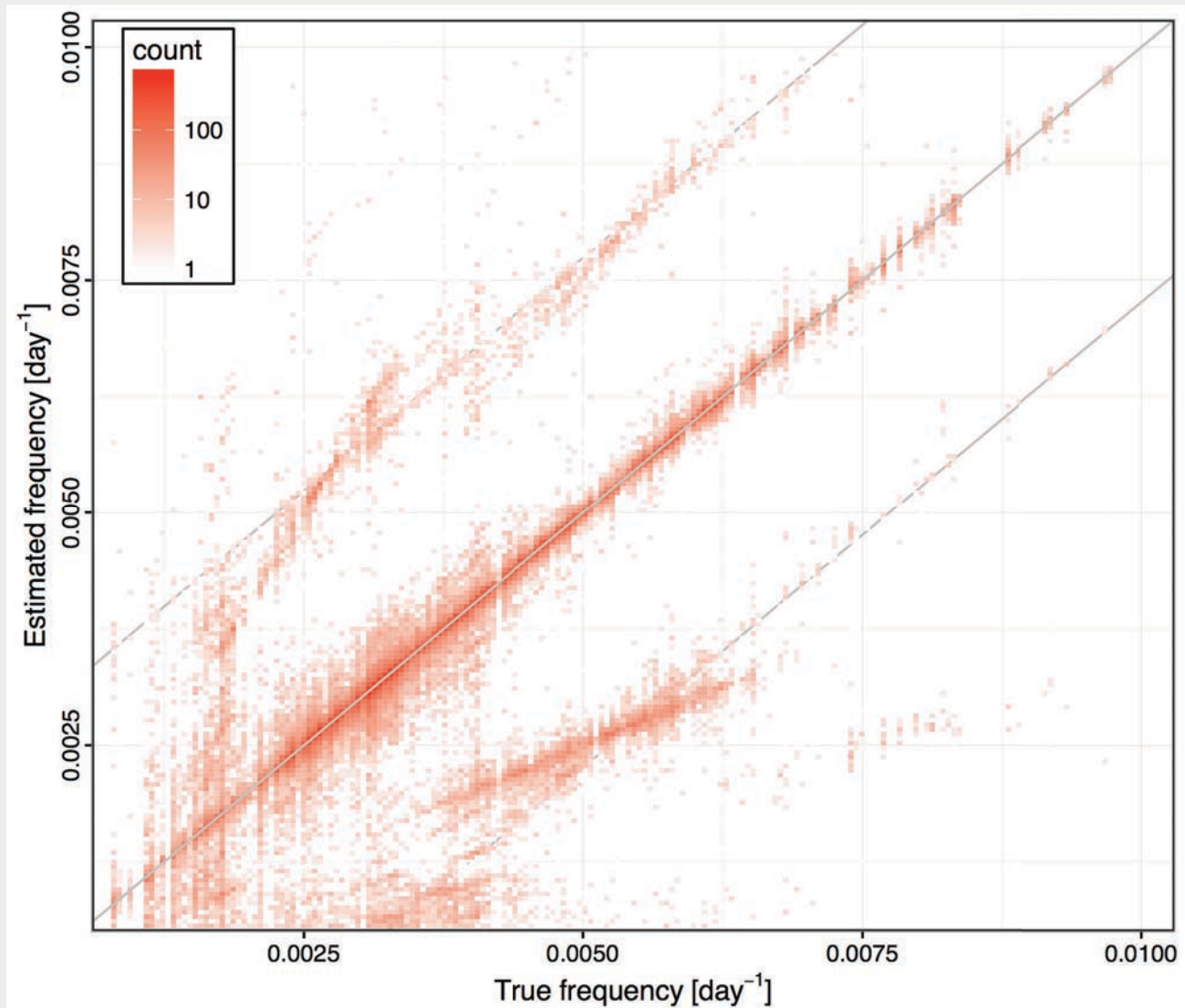
# GAUSSIAN PROCESS PERIODOGRAM

APPLIED TO NOISIER & SPARSER SIMULATED LIGHT CURVE



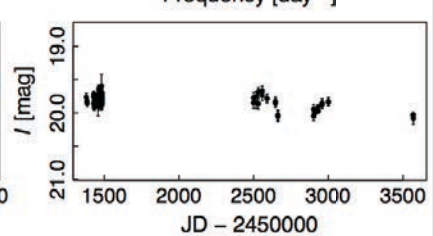
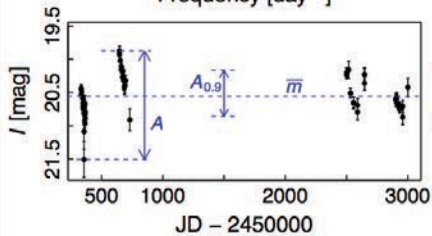
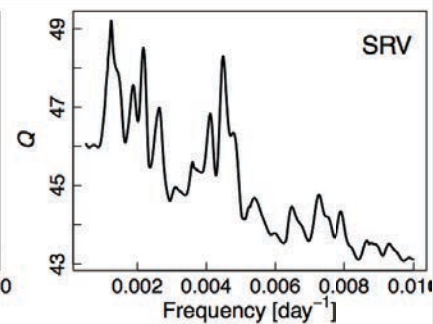
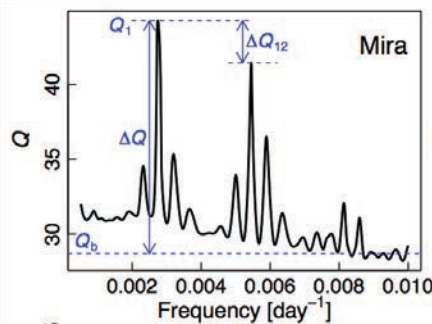
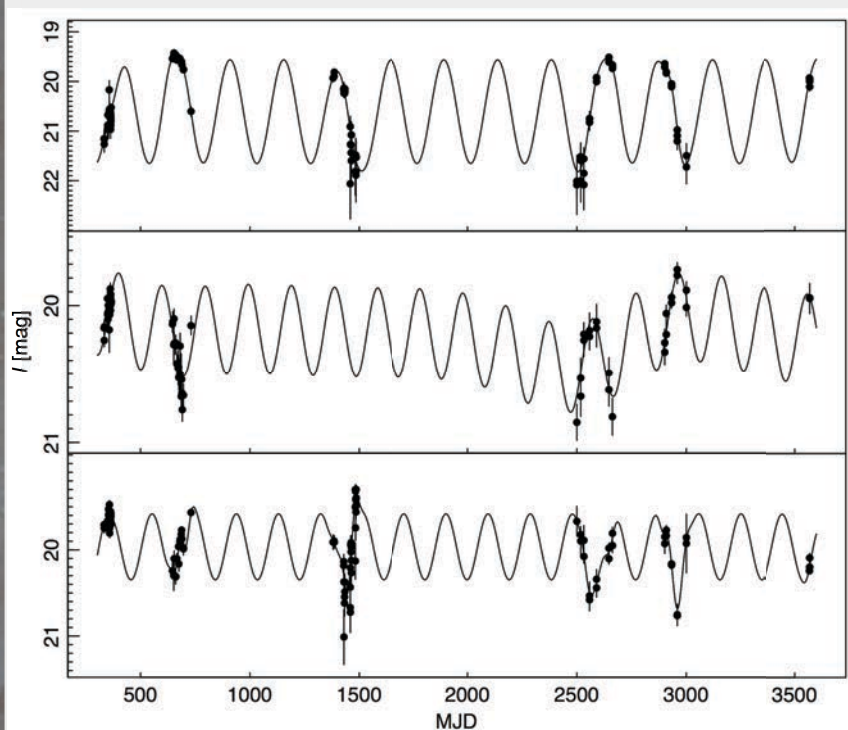
# GAUSSIAN PROCESS PERIODOGRAM

SUCCESSFULLY RECOVERED PRIMARY PERIOD FOR  
74% OF SIMULATED LIGHT CURVES



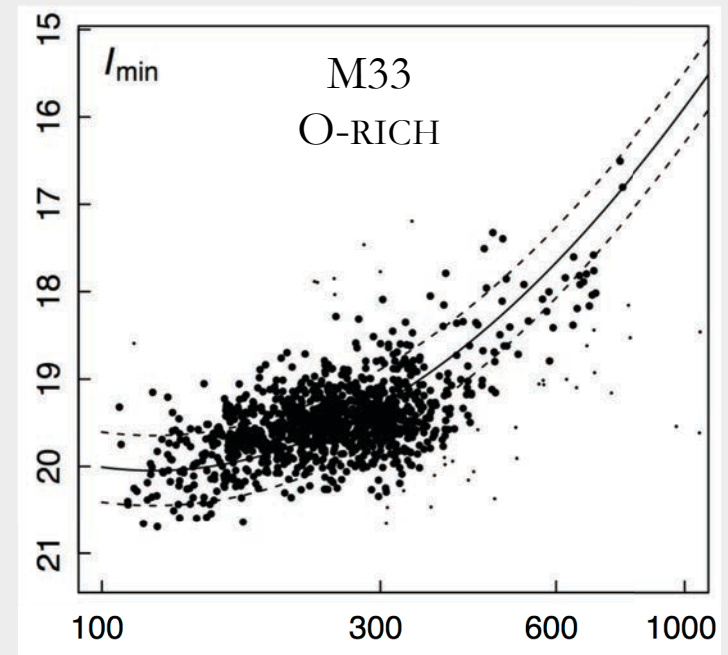
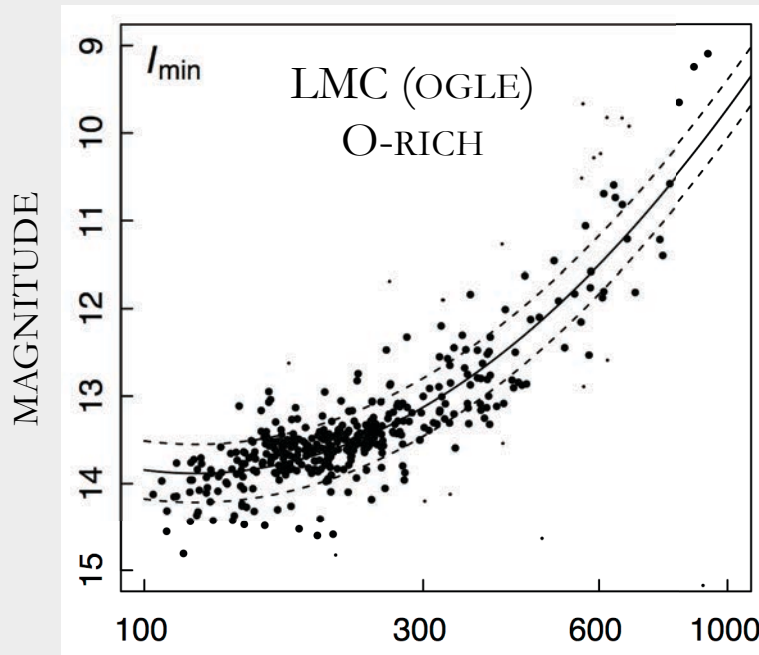
# FIRST RESULTS FROM M33

- Searched for Miras among  $2.4 \times 10^5$  stars in M33
  - Based on I-band data only, spanning  $\sim 7$  years
  - Used Random Forest classifier trained on 18 features
- Discovered  $>1800$  Mira candidates



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PERIOD

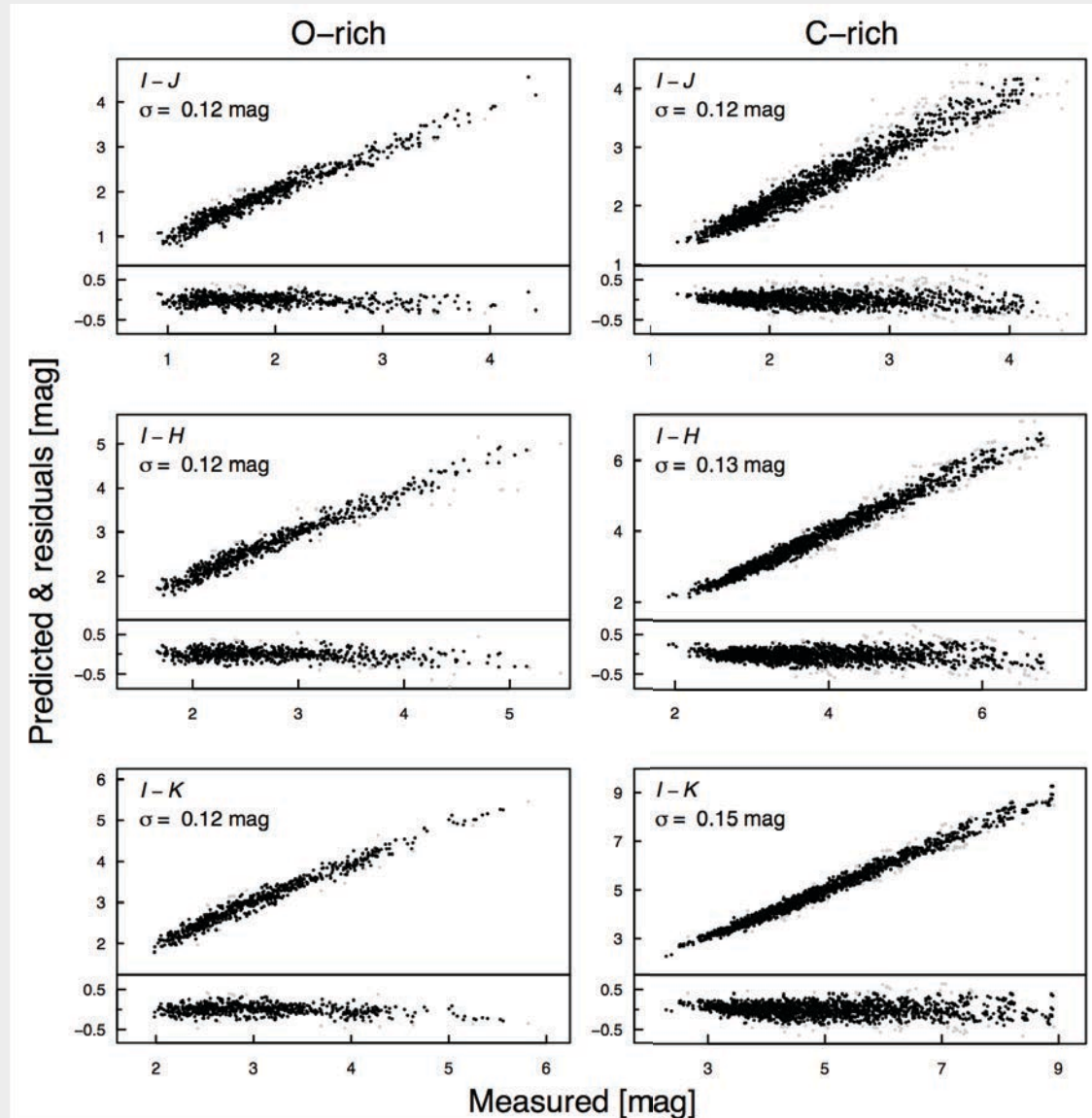
# LMC MIRA SAMPLE

- 690 Miras from Soszyński, Udalski, Szymański+ 2009
  - O/C-rich classification
  - 668 with JHKs magnitudes from our observations
- Issue: NIR observations concentrated at just three phases for a given variable, due to long periods
- Solution: Use OGLE I-band light curves to generate JHK<sub>S</sub> templates through regression techniques
- Derive PLRs for O- and C-rich Miras



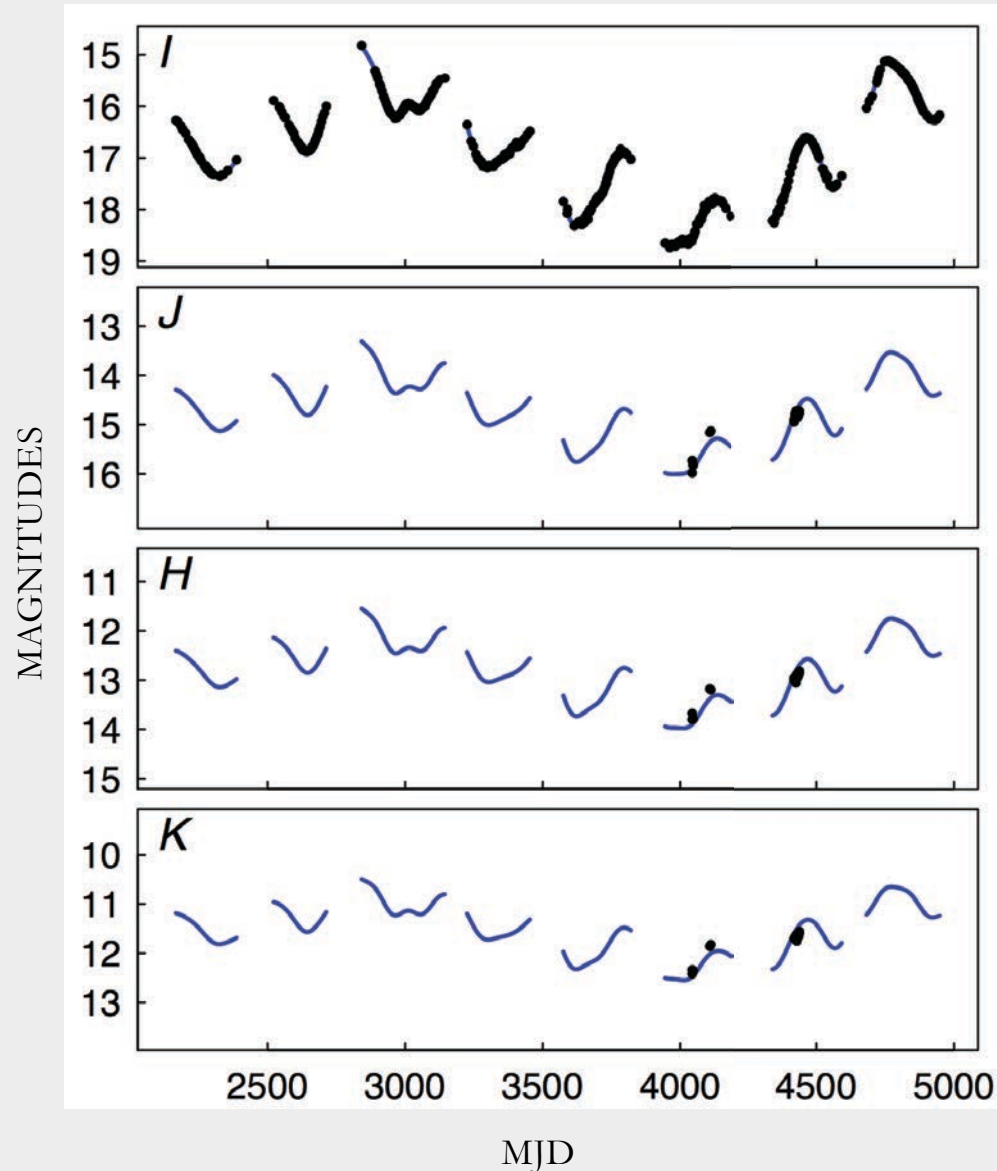
# REGRESSION MODEL

BASED ON  $\sim 82,000$  INDIVIDUAL  $JHK_S$  MEASUREMENTS + OGLE LIGHT CURVES

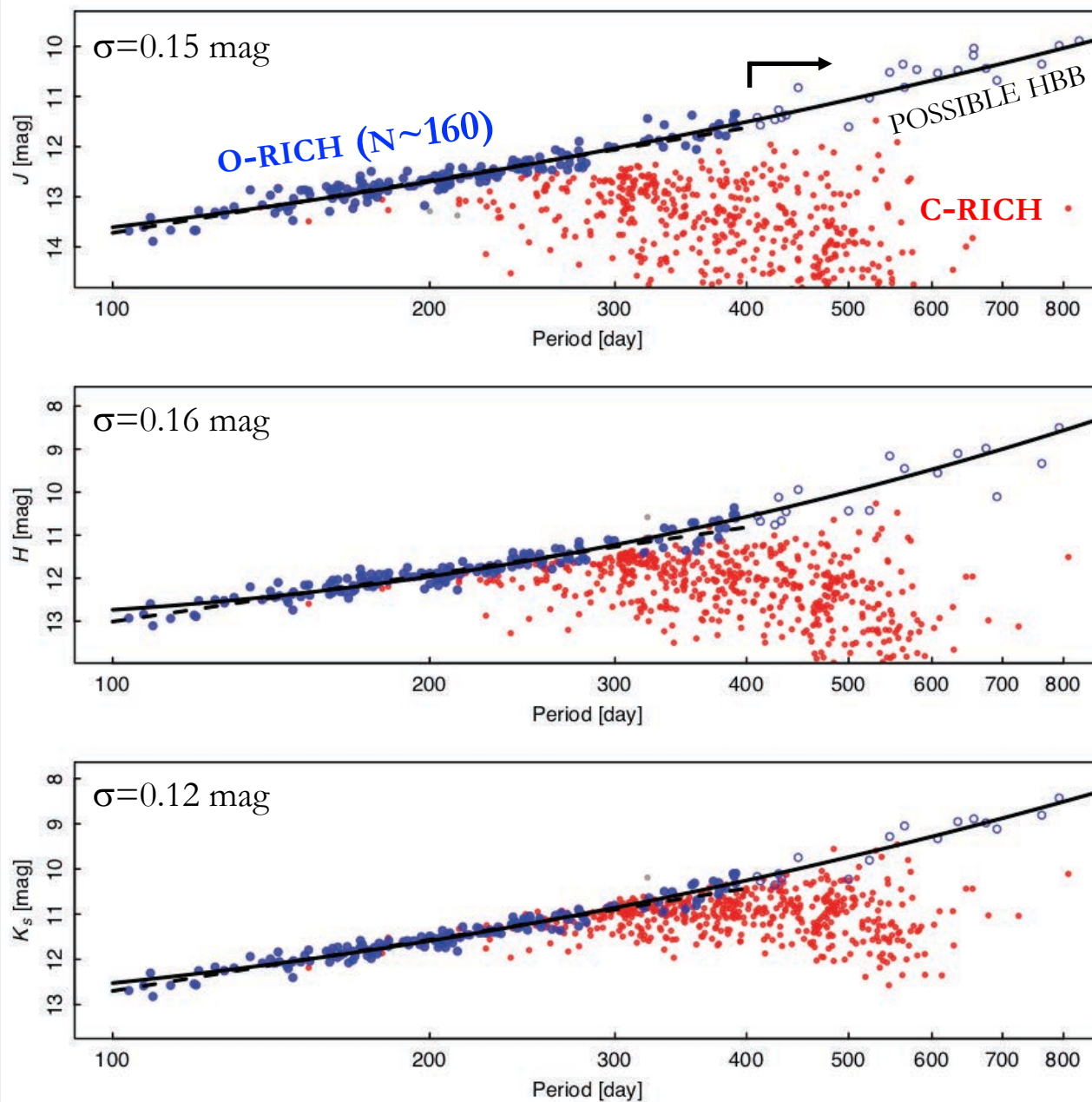


# MIRA TEMPLATE LIGHT CURVES

USE 3 NIR PHASE POINTS + TEMPLATE TO ESTIMATE MAX, MEAN, MIN

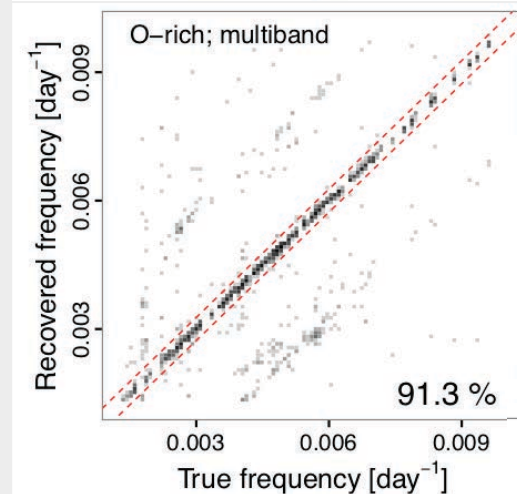
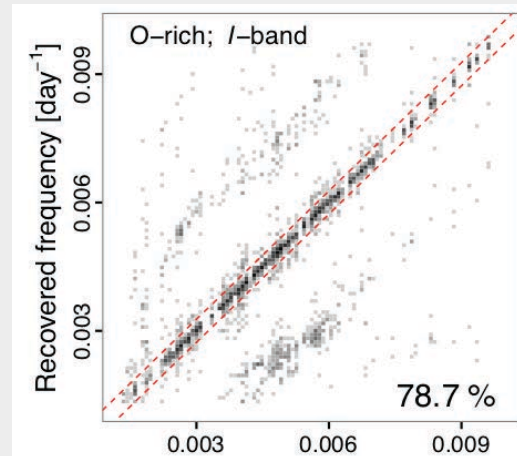
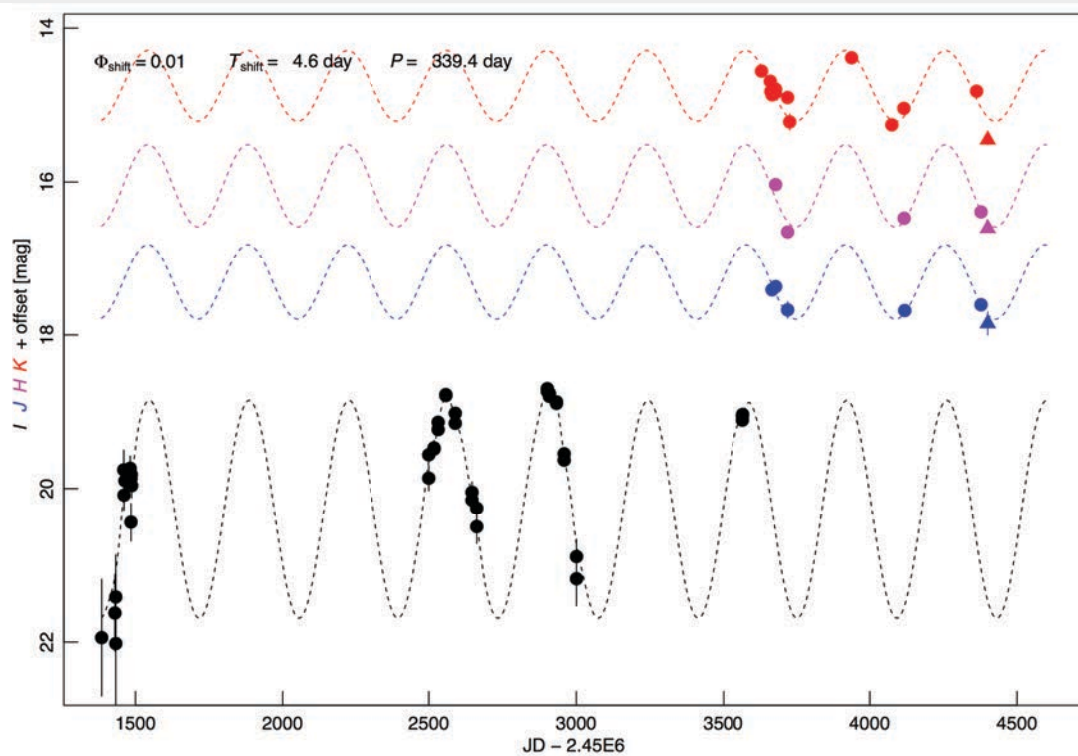


# LEAVITT LAWS FOR LMC MIRAS

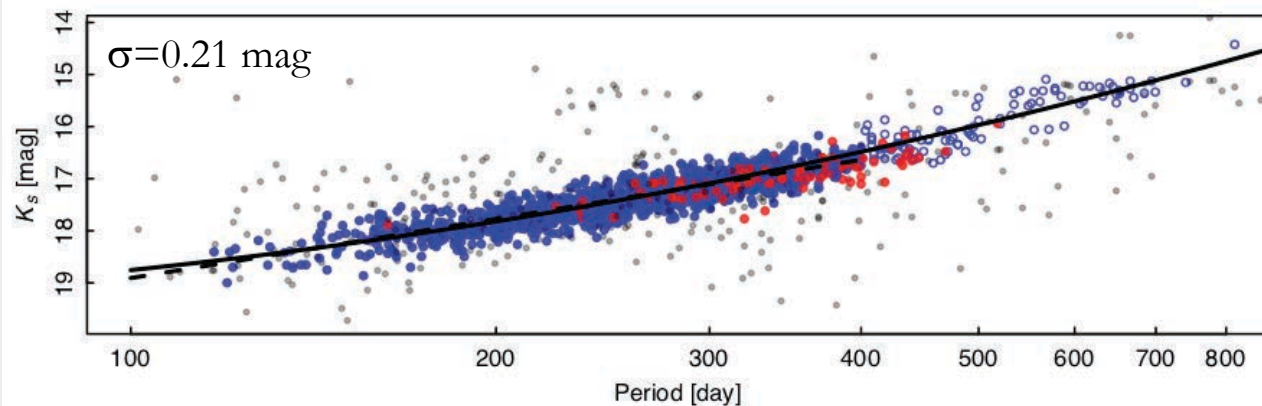
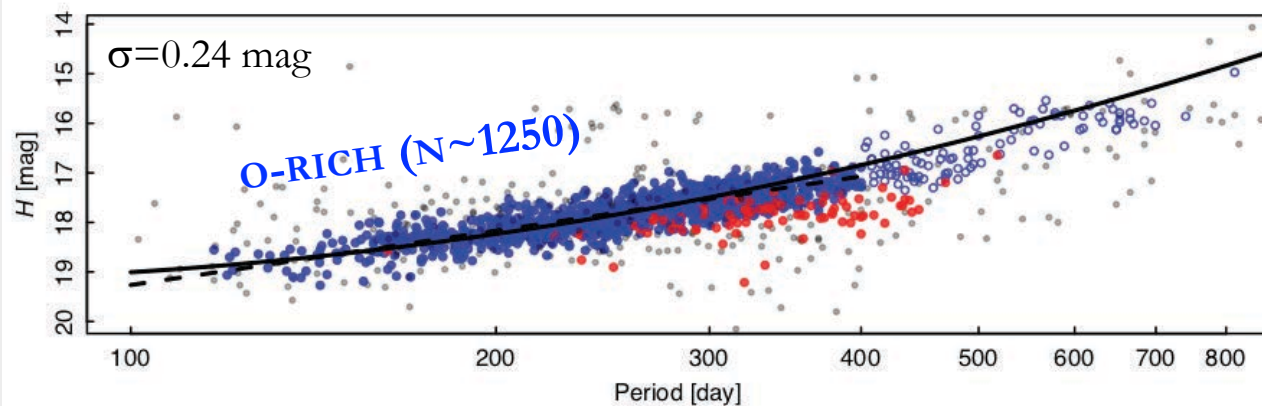
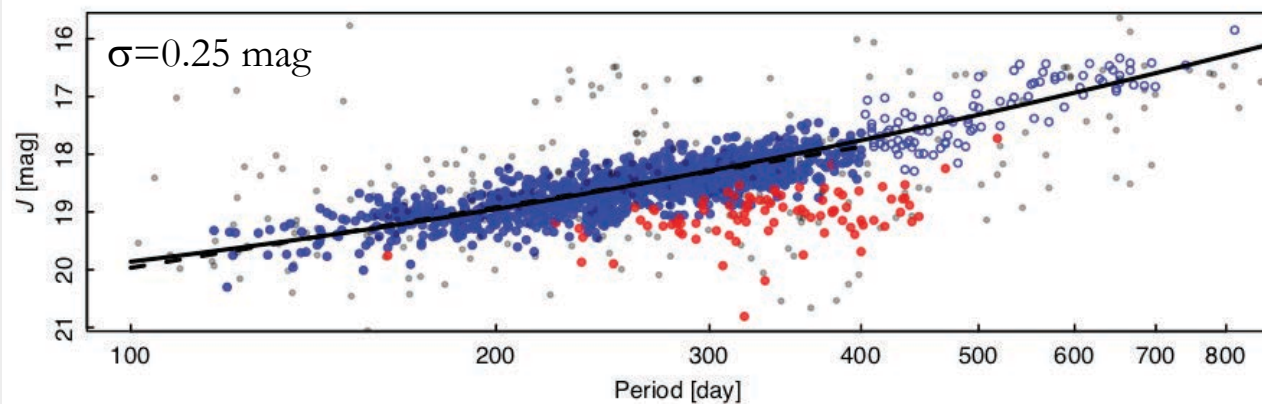


# BACK TO M33

- Fit multi-band model to our JHK<sub>s</sub> magnitudes (Gemini N, KPNO) and Javadi+2015 (UKIRT)
  - Significantly improved period recovery!

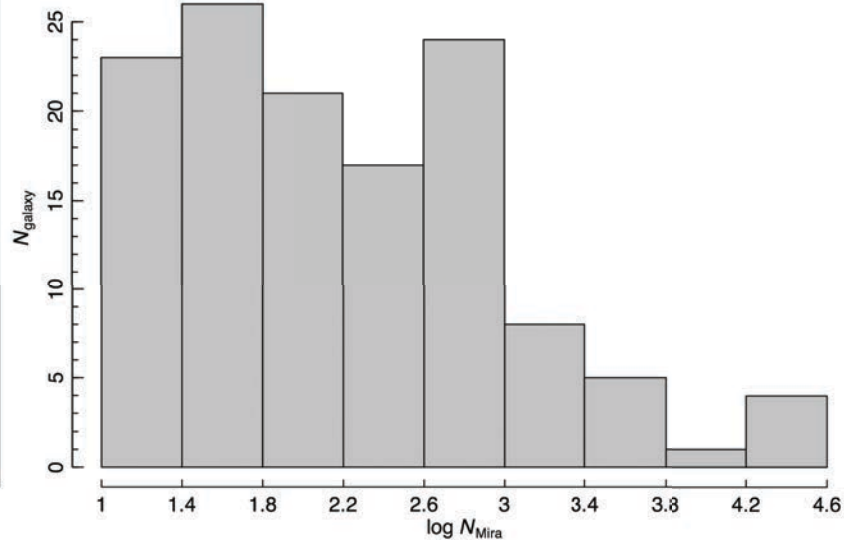
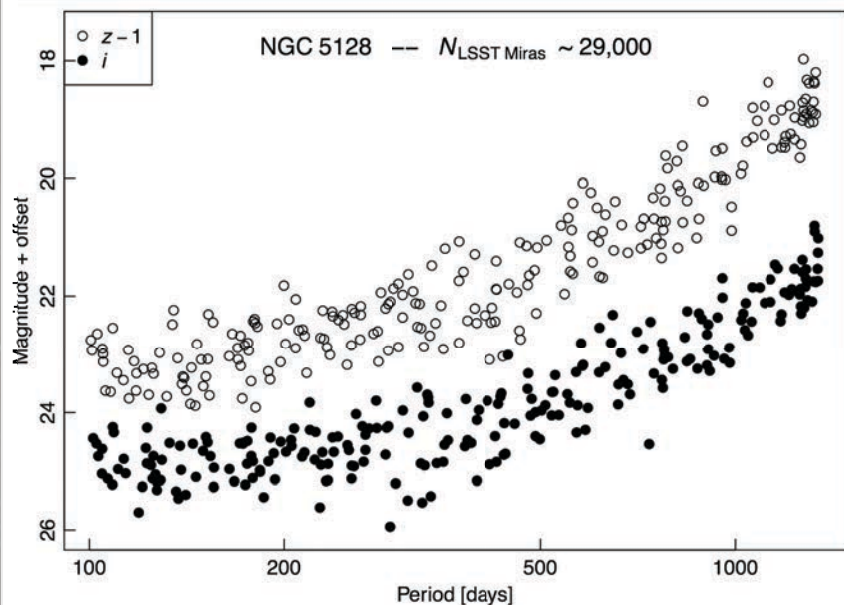


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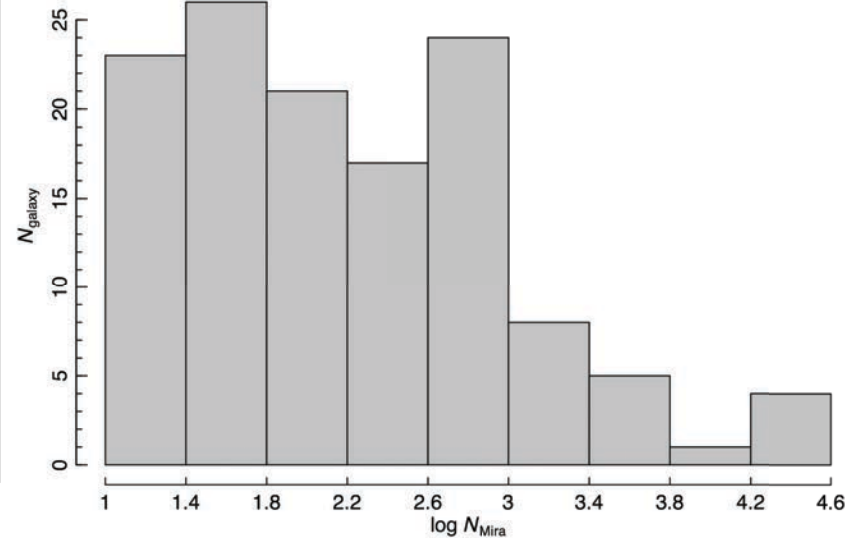
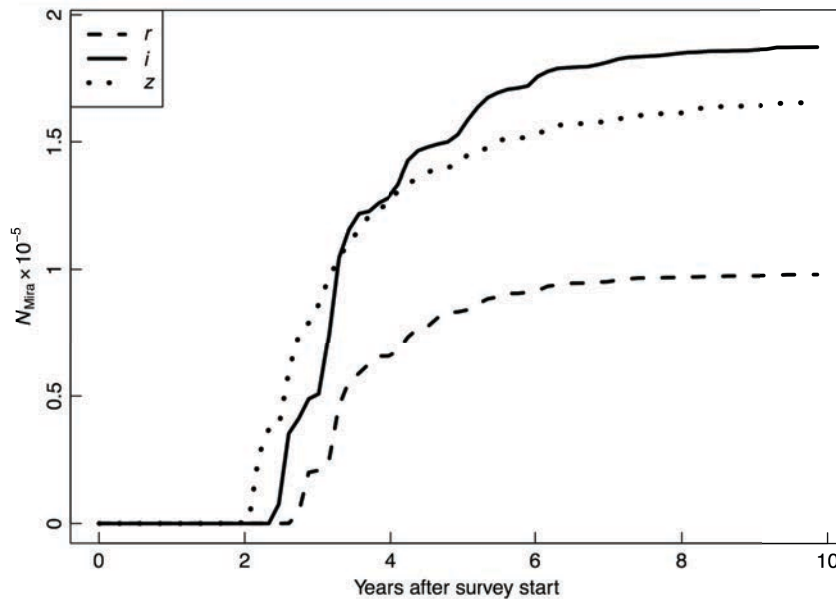
# PROSPECTS FOR LSST

- Next: extension of Gaussian Process periodogram to *griz* bands, test on simulated LSST light curves
- LSST:  $\gtrsim 70$  galaxies with  $\gtrsim 100$  Miras within 4 years

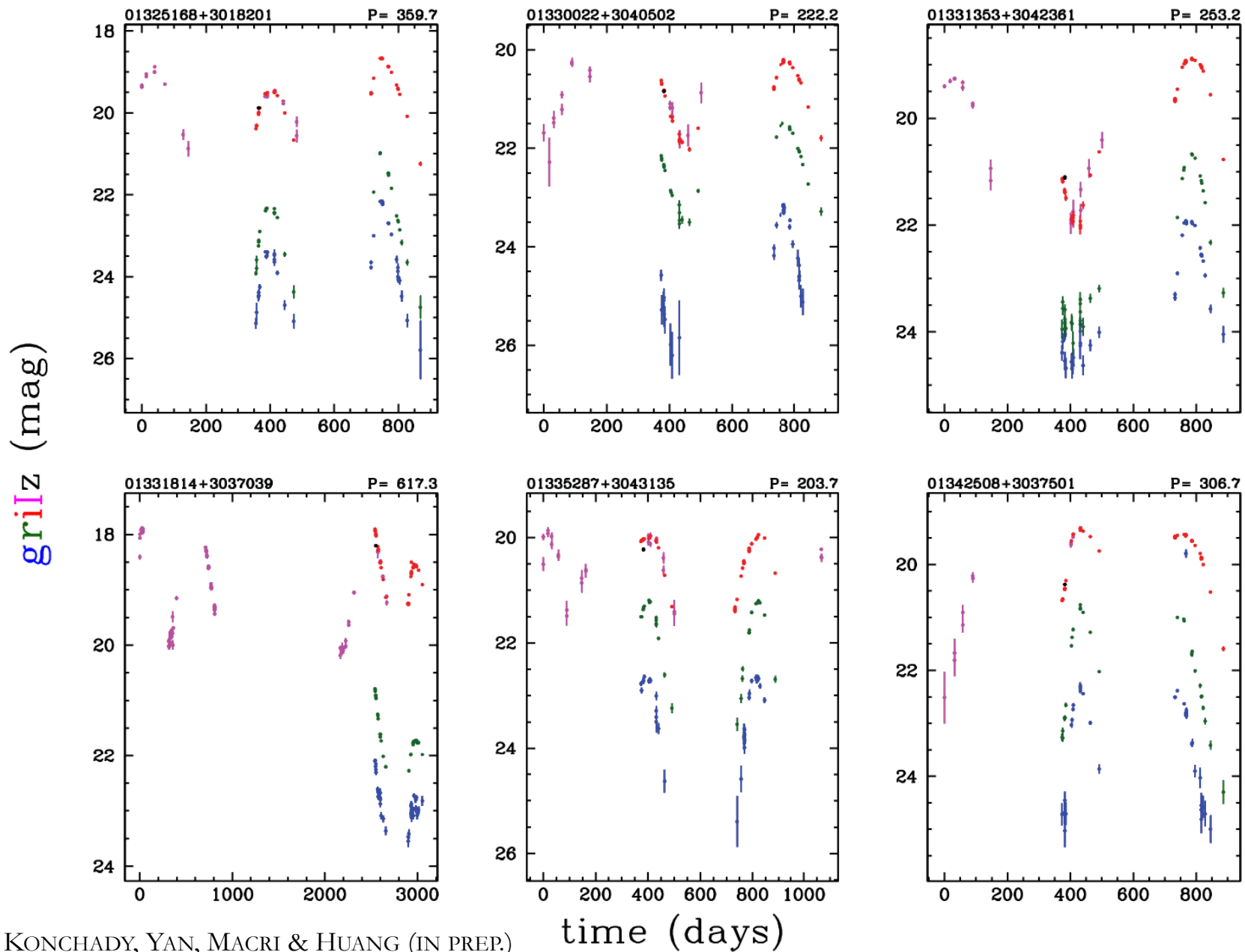


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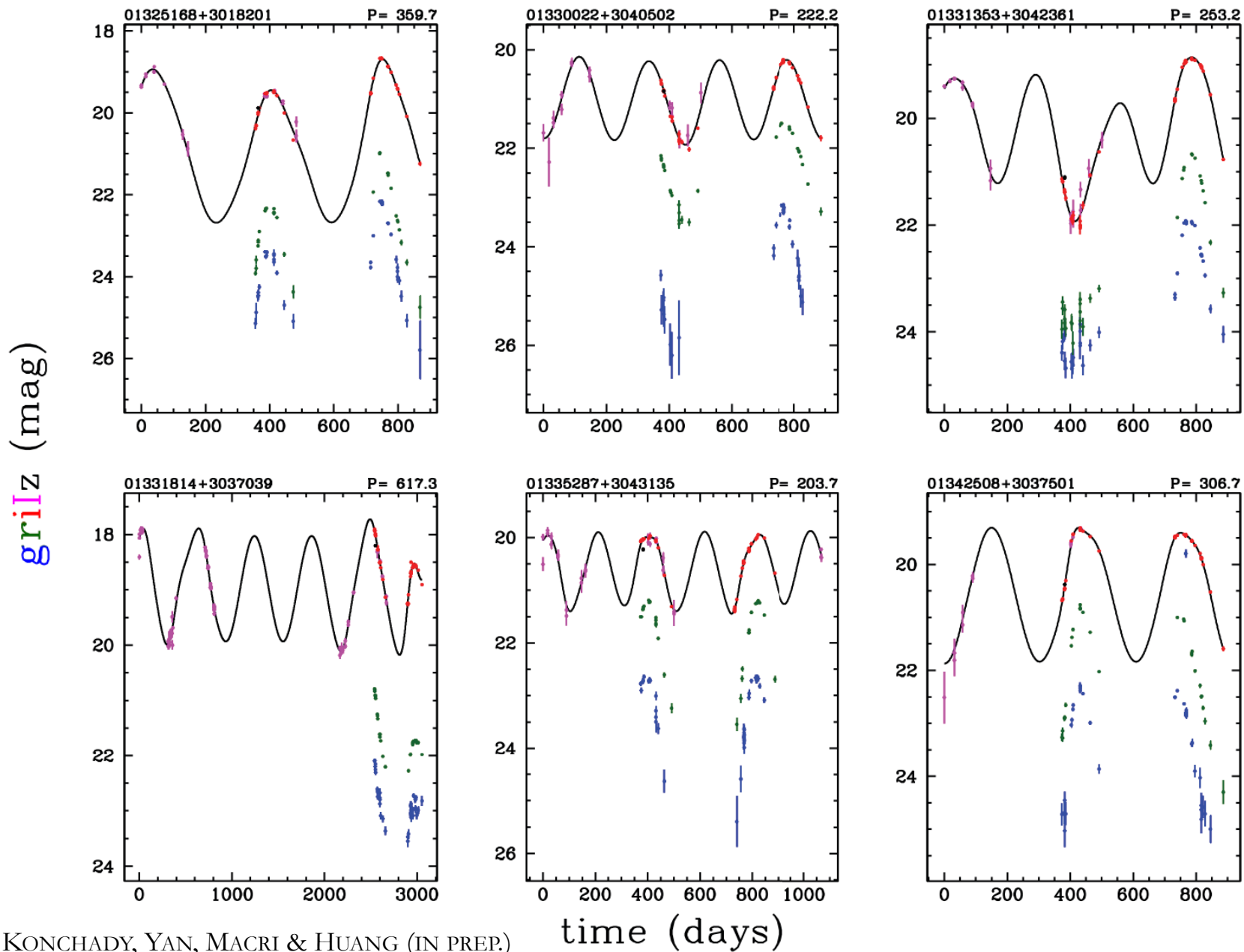


# M33 MIRAS IN LSST BANDS





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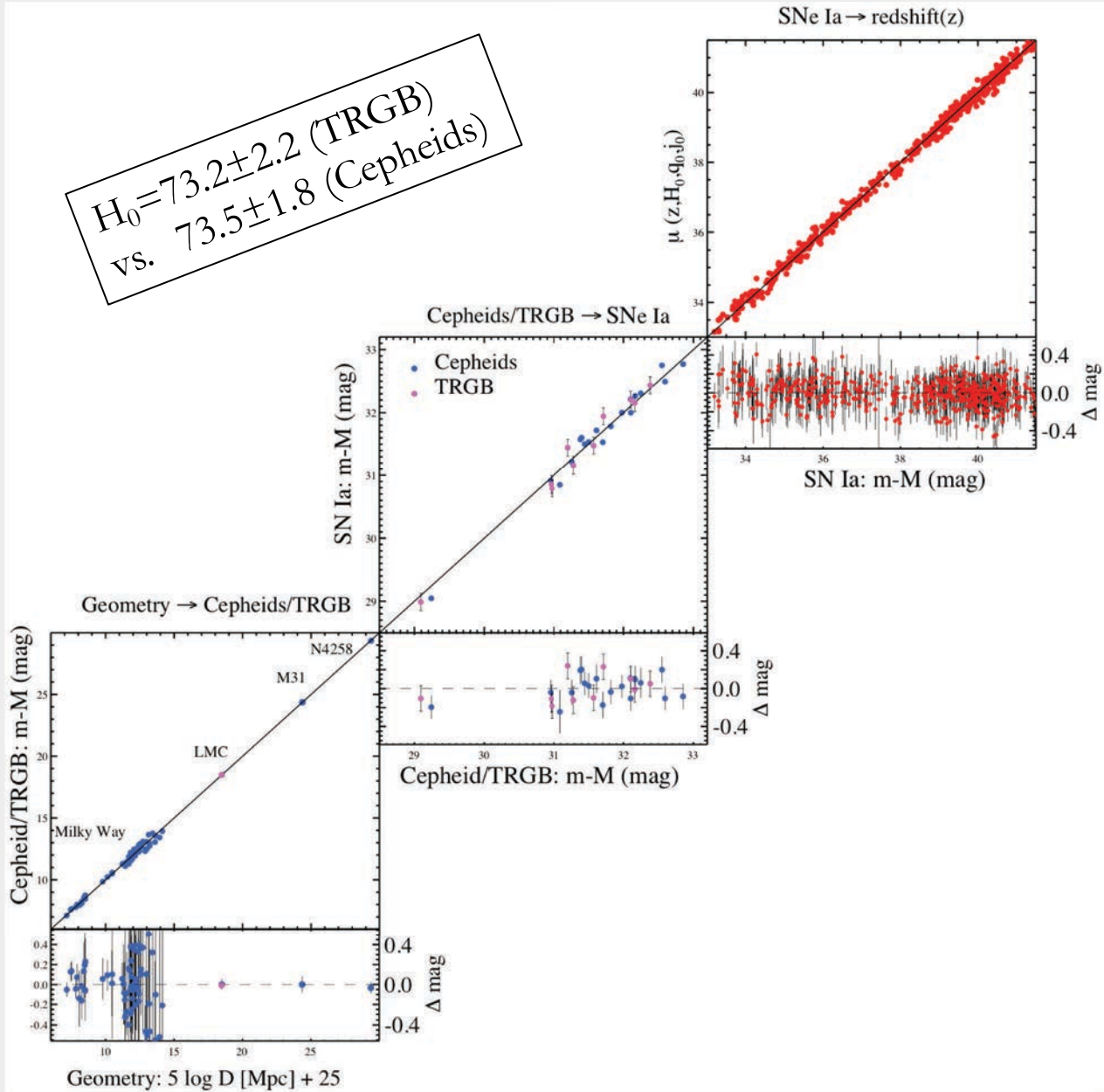


# CEPHEIDS VS. TRGB

- Distances to 10 SNe Ia hosts using Cepheids vs. TRGB, anchored to LMC ( $D=49.6 \text{ kpc} \pm 1.1\%$ , Pietrzynski+2019)
- Cepheids: HST/WFC3 F160W
  - LMC: Riess+2019; SN hosts: Riess+2016
- TRGB: HST/ACS F814W
  - SN hosts: Jang & Lee 2017, Hatt+2018
  - LMC:  $I_0=14.52\pm0.04 \text{ mag}$ ,  $A_I=0.10\pm0.02 \text{ mag}$  (Jang & Lee 2017, OGLE-III)  
 $-0.01\pm0.02 \text{ mag}$  (ground-to-HST transformation) yields  
 $M_{\text{TRGB}}=-3.97\pm0.04 \text{ mag}$  (Yuan+, in prep.; see poster)
- $H_0=73.2\pm2.2$  (TRGB) vs  $73.5\pm1.8$  (Cepheids)

# CEPHEIDS VS TRGB

$H_0 = 73.2 \pm 2.2$  (TRGB)  
vs.  $73.5 \pm 1.8$  (Cepheids)



# DO CEPHEIDS & TRGB AGREE?

Depends on which LMC TRGB calibration you adopt...  
( $\mu=18.477$  mag in all cases below)

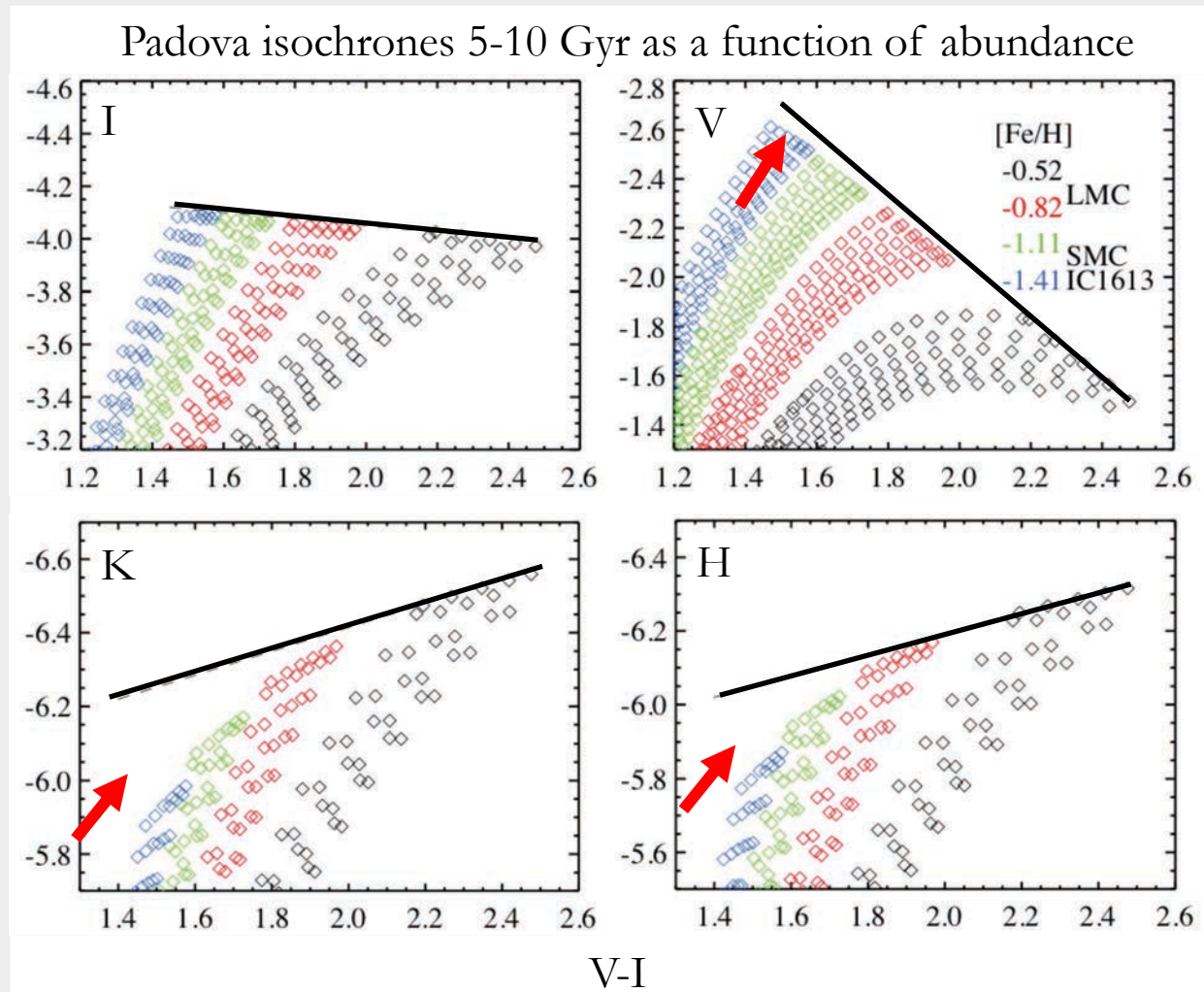
$A_I$ (mag)	Extinction method	$I_{\text{obs}}$	$M_I$	$H_0$	Source
$0.10 \pm 0.02^*$	OGLE red clump	14.62	$-3.97 \pm 0.03^*$	73.2	Jang & Lee 17
$0.05 \pm 0.05$	NIR colors within LMC	$14.59 \pm 0.02$	$-3.95 \pm 0.03$	73.9	Hatt+18, Hoyt+17
$0.16 \pm 0.02$	hosts w/diff. [Fe/H]	$14.60 \pm 0.02$	$-4.05 \pm 0.02$	69.8	Freedman+19

\*: provided by Jang & Lee

3 different methods for estimating extinction  $\rightarrow$  5% changes in  $H_0$   
There are  $3\sigma$  differences among these...could [Fe/H] explain?

# TRGB COLORS TO INFER EXTINCTION

Freedman+2019 estimate LMC extinction using linear color slope,  
but TRGB depends on age *and* metallicity



LMC too bright  
relative to lower  
[Fe/H] SMC,  
IC 1613

Stellar models  
indicate extinction  
overestimated by  
 $A_I \sim 0.1$  mag;  
5% lower  $H_0$

see also  
McQuinn+2019

RGB [Fe/H]: LMC  $\sim -0.6$ , SMC  $\sim -1.2$  (Nidever+ 2019); IC 1613  $\sim -1.4$  (Sibbons+2015)

# INDEPENDENT $H_0$ ESTIMATES

flat  $\Lambda$ CDM

