

# Single and Multi-Planet Systems from *Kepler*

- Occurrence of Planets
- Statistics of Multi-Planet Systems
- Low False Positive Rate

Geoff Marcy  
UC Berkeley

# Acknowledgements

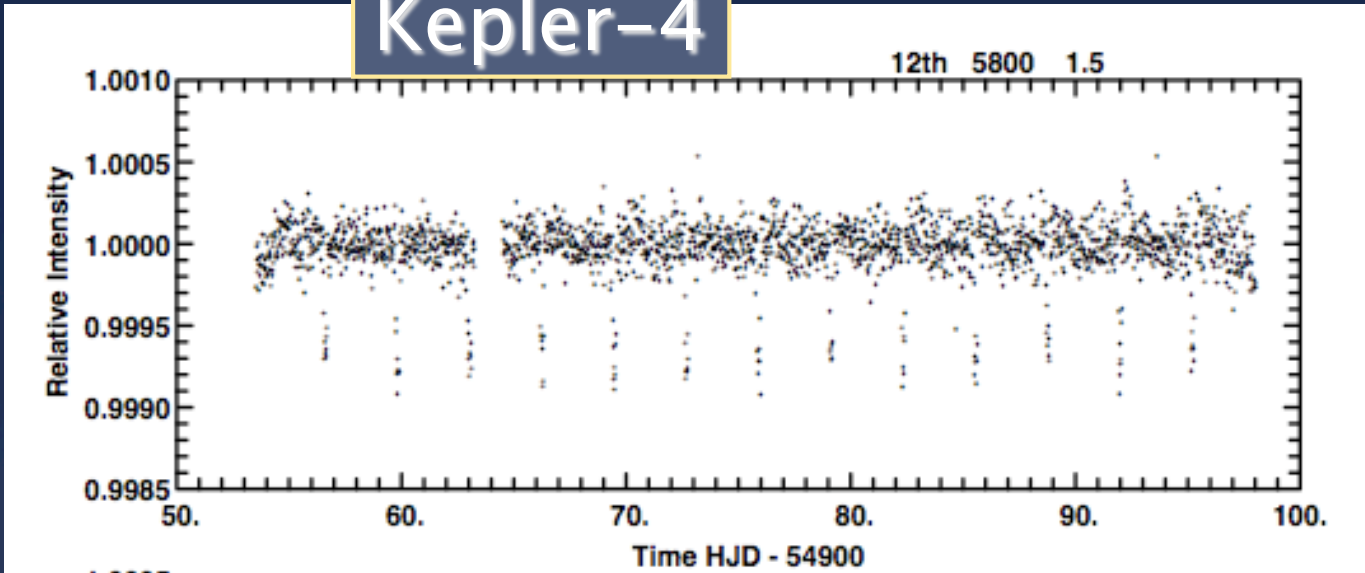
## *Kepler* Team:

Jack J. Lissauer, Daniel C. Fabrycky, Darin Ragozzine,  
Jason H. Steffen, Eric B. Ford, Jon M. Jenkins,  
Avi Shporer, Matthew J. Holman, Jason F. Rowe, Elisa V.  
Quintana, Natalie M. Batalha, William J. Borucki, Stephen T.  
Bryson, Douglas A. Caldwell, Joshua A. Carter, David Ciardi,  
Edward W. Dunham, Jonathan J. Fortney, Thomas N. Gautier III,  
Steve B. Howell, David G. Koch, David W. Latham,  
G Robert C. Morehead, Dimitar Sasselov

## Special Thanks to:

**Jack Lissauer, Andrew Howard**

# Kepler-4

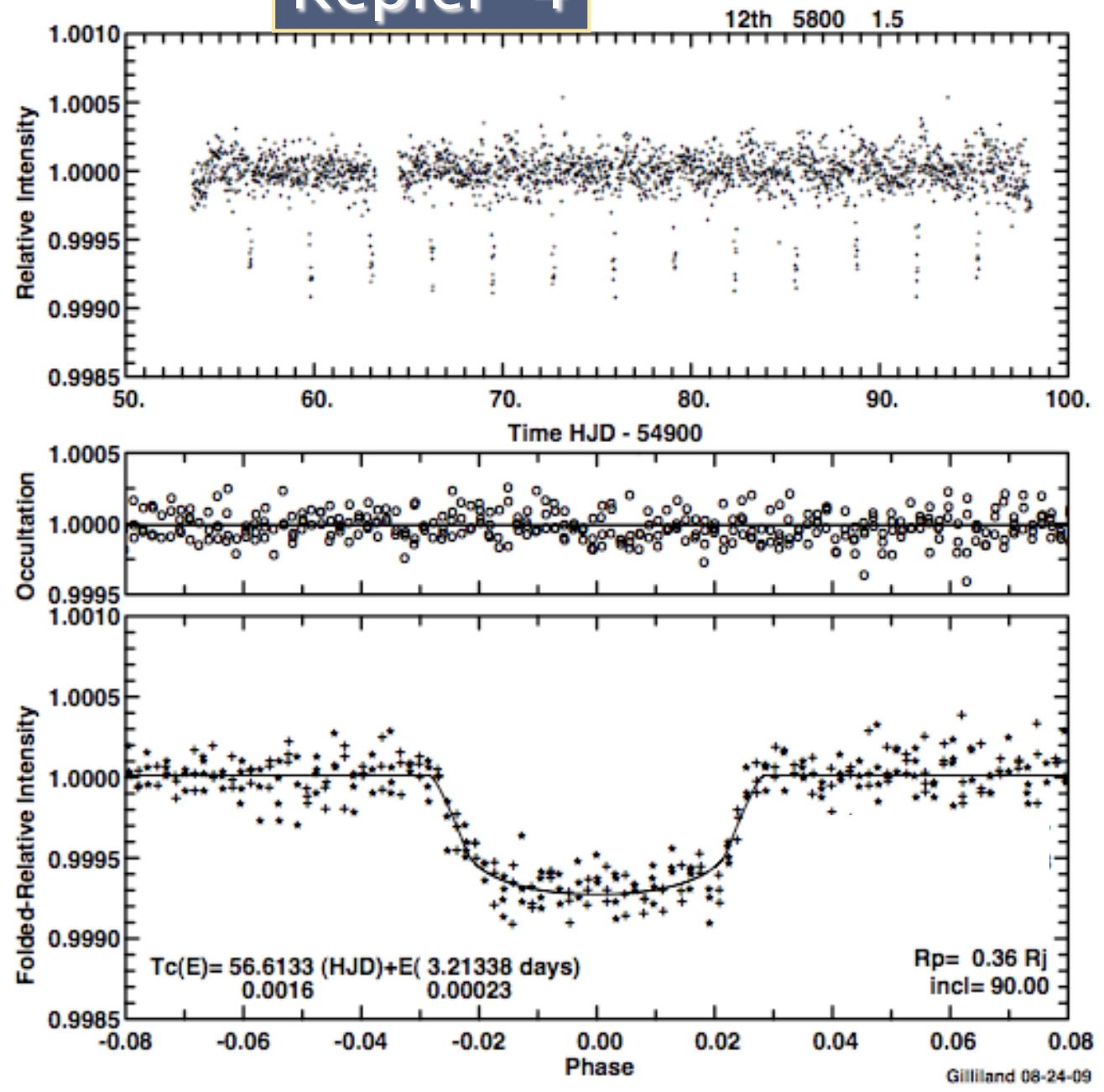


Planet Properties:

Period = 3.213day

Radius = 4.1 R<sub>Earth</sub>

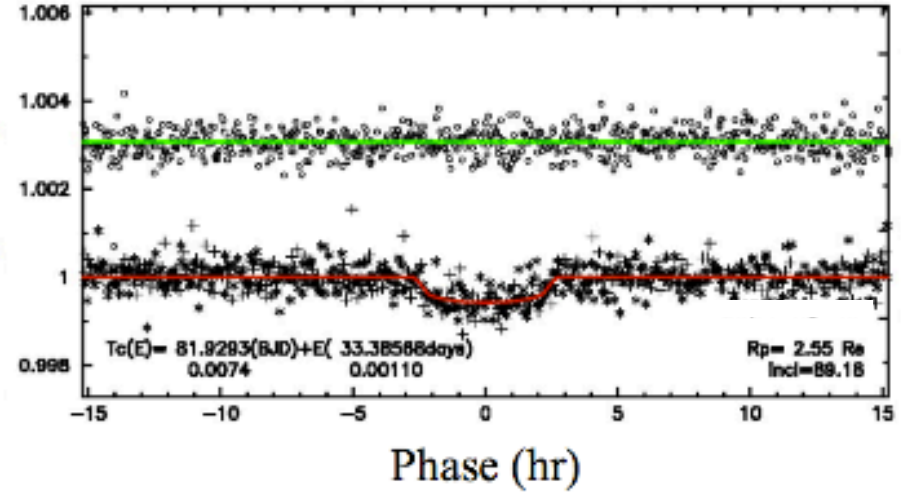
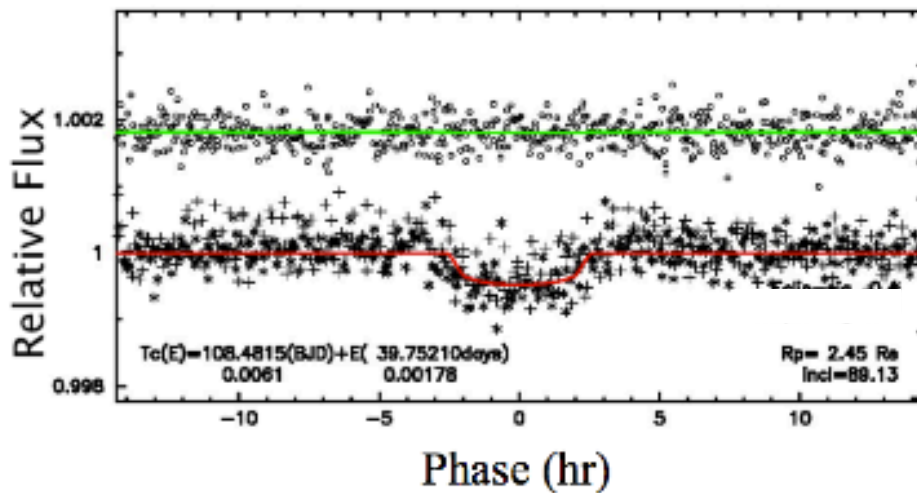
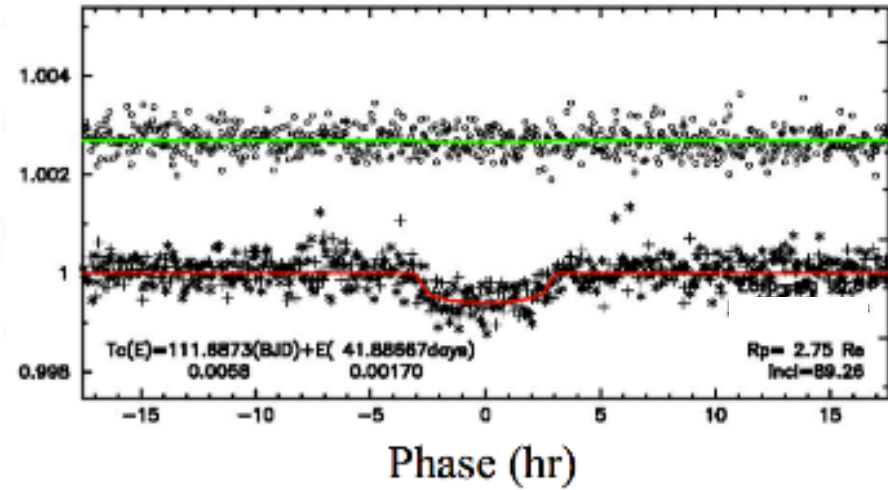
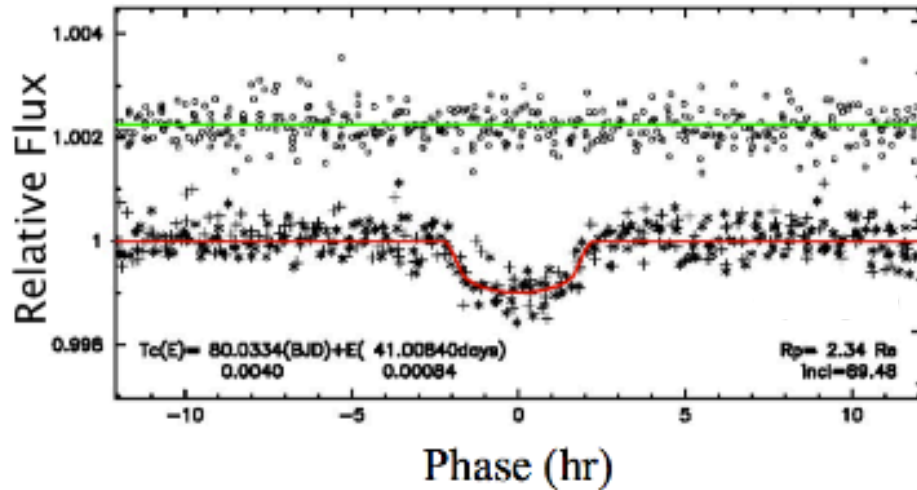
# Kepler-4



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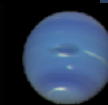
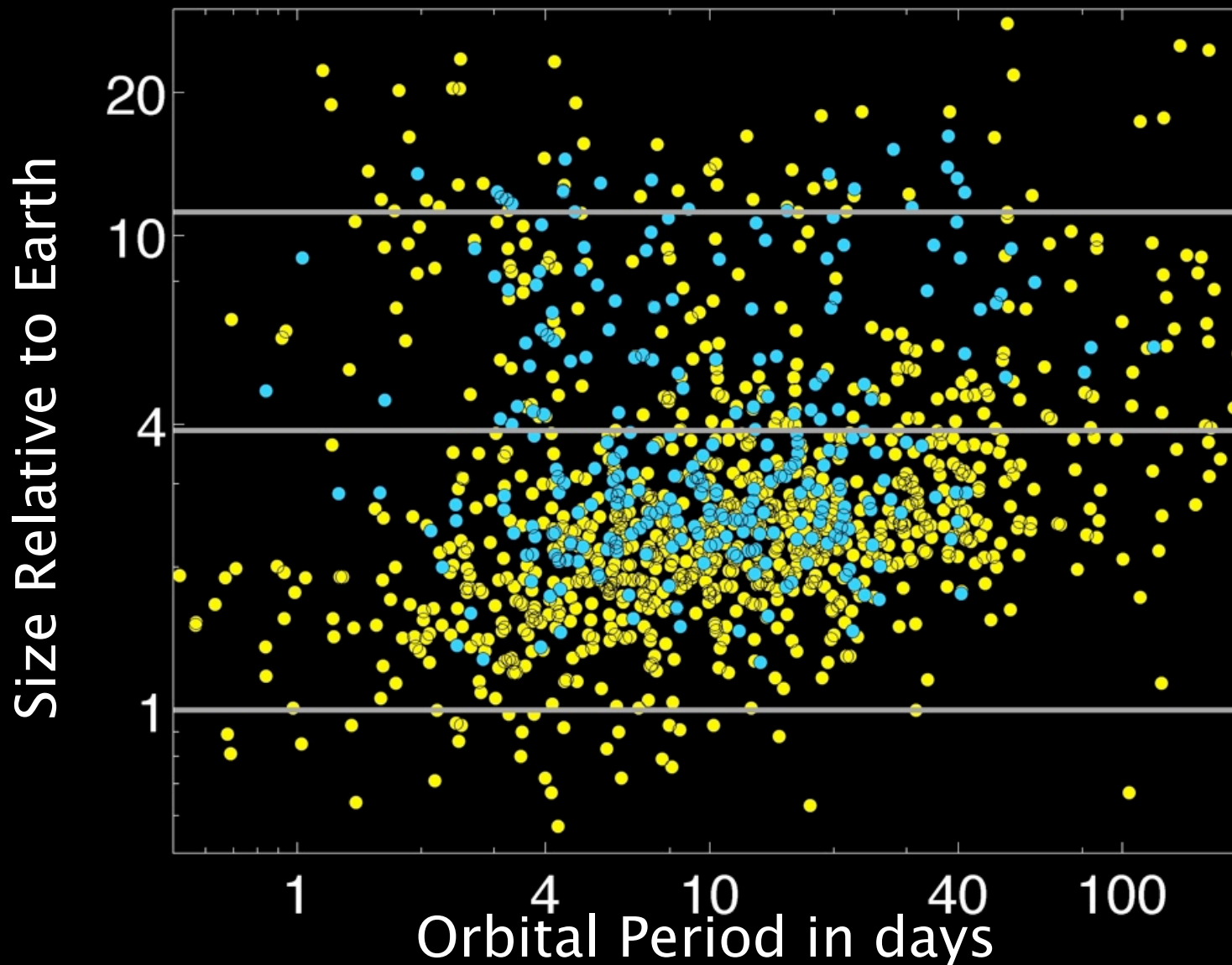
Representative

Kepler Transits:  $R = 2 - 3 R_{\text{Earth}}$

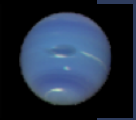
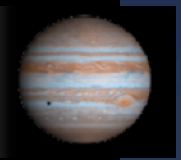
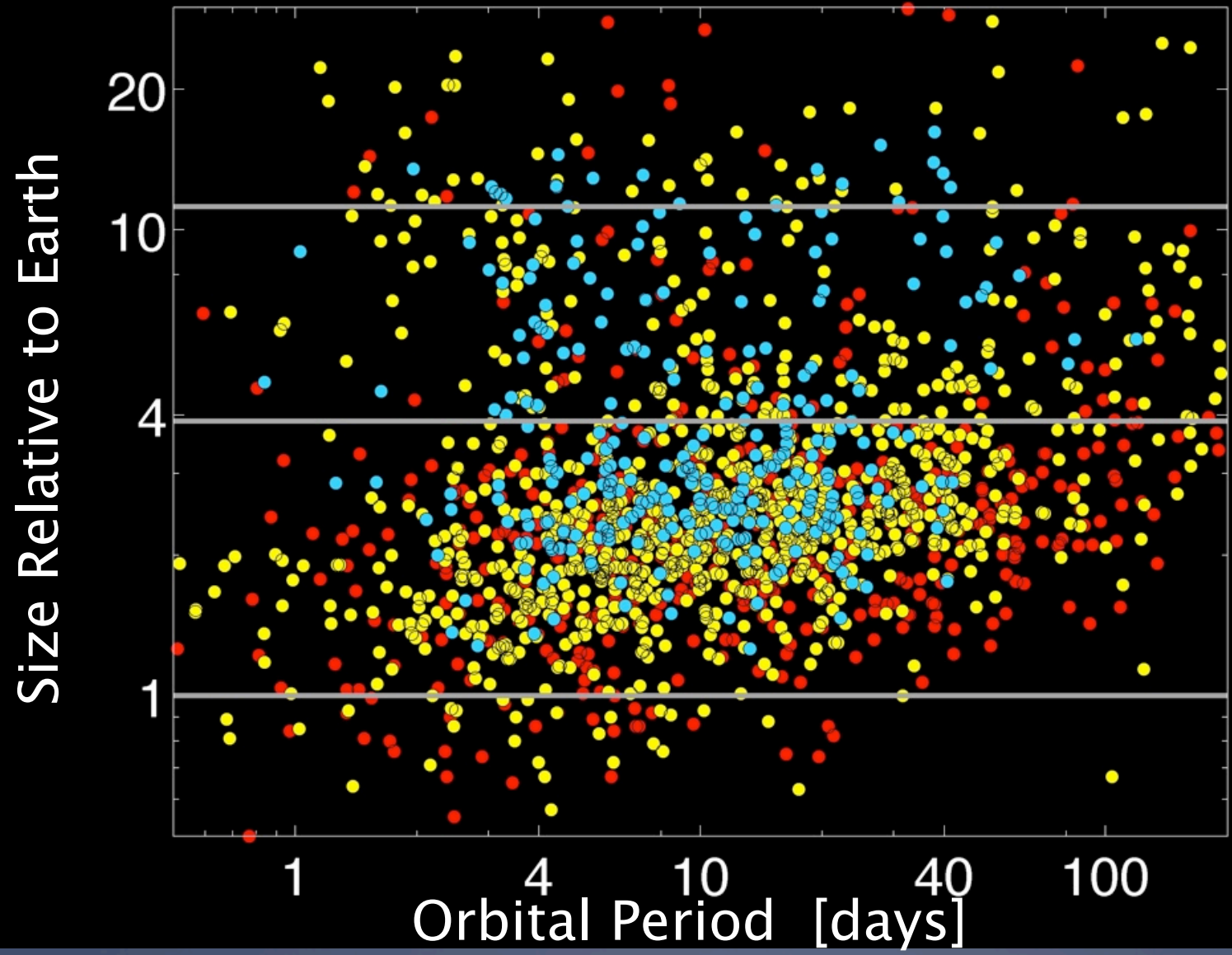


1235

# Planets Candidates as of Feb 2011



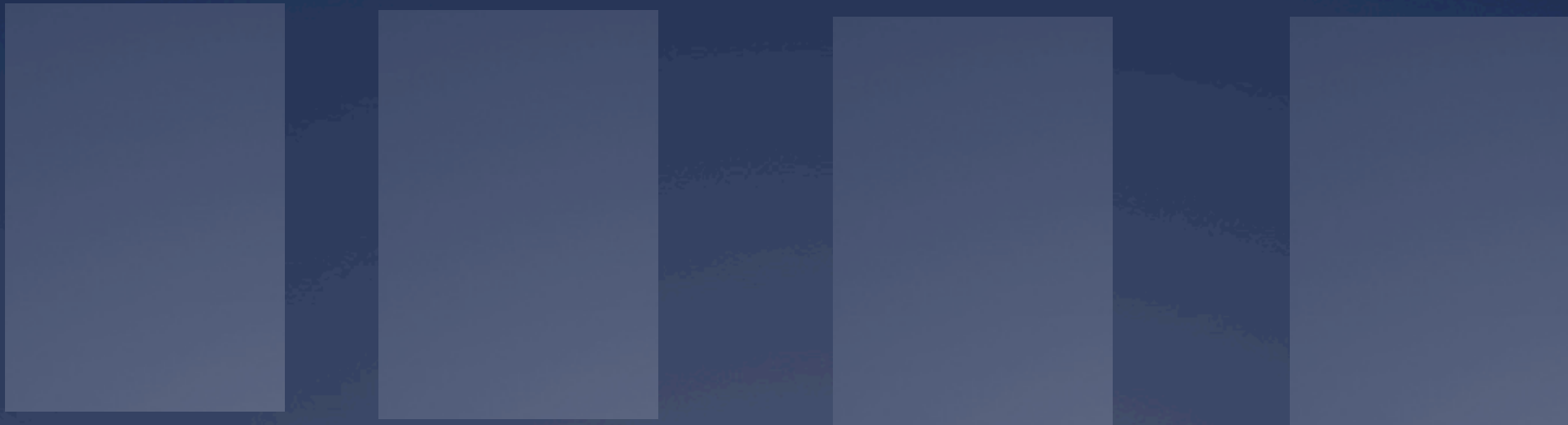
# 1781 Planets Candidates as of Sep 2011



# 1781 Planet Candidates as of Sep 12, 2011



45 % increase since February 2011





# 1781 Planet Candidates as of Sep 12, 2011



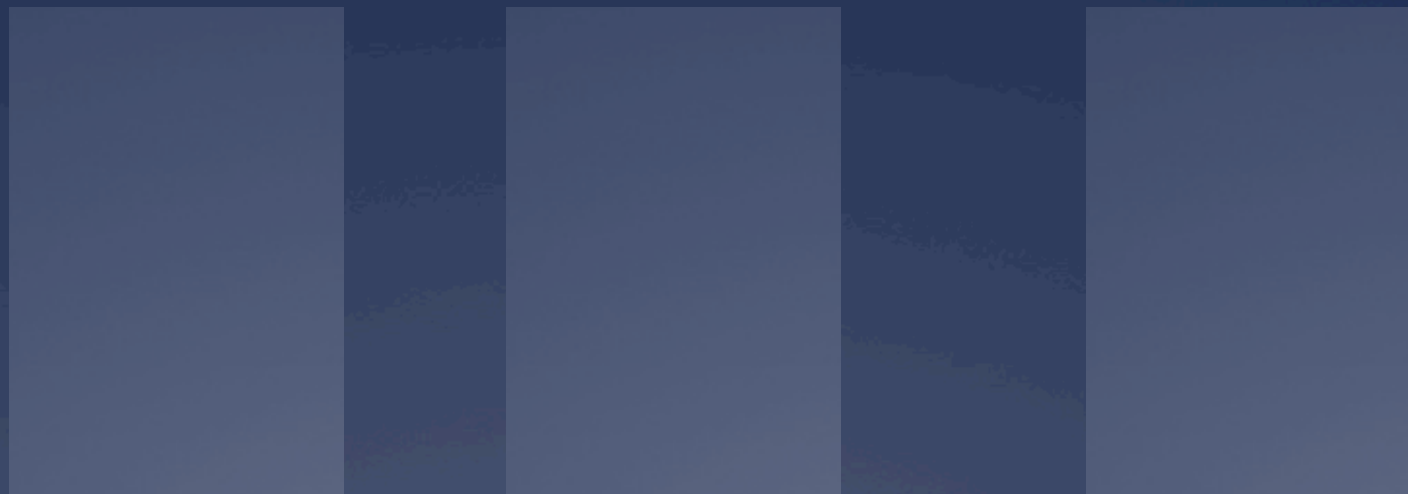
45 % increase since February 2011

↑95%



<1.25 R<sub>e</sub>

123



# 1781 Planet Candidates as of Sep 12, 2011



45 % increase since February 2011

↑ 95%



< 1.25 R<sub>e</sub>

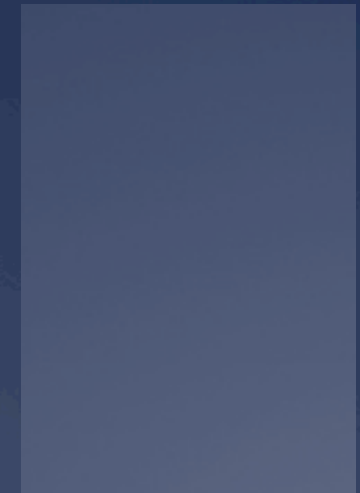
123

↑ 58%



1.25 – 2 R<sub>e</sub>

412



# 1781 Planet Candidates as of Sep 12, 2011



45 % increase since February 2011

↑95%



<1.25 R<sub>e</sub>

123

↑58%



1.25 – 2 R<sub>e</sub>

412

↑41%



2 – 6 R<sub>e</sub>

988



# 1781 Planet Candidates as of Sep 12, 2011



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↑95%



<1.25 R<sub>e</sub>

123

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412

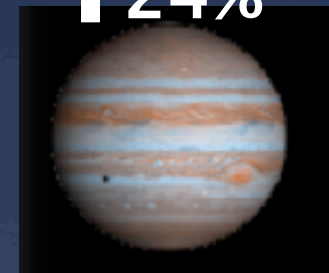
↑41%



2 – 6 R<sub>e</sub>

988

↑24%



6 – 15 R<sub>e</sub>

204

# Occurrence of Planets: Correct for Biases in *Kepler*

- \* 1) Consider only Main Sequence FGK stars (and their planets)
- \* 2) Operate in differential cells in the plane:  $R_{pL}$  – Period
- \* 3) Correct for:
  - 3a) Non-transiting geometries
  - 3b) Varying detectability (Photometric Noise in each star)

# Define Planet Occurrence

For each  $R_{pL}$  and Period:

Choose planets carefully:

- Signal/noise  $> 10$
- Correct for inclined orbits

$$\text{Occurrence} = \frac{\# \text{ planets}}{\# \text{ stars}}$$

Choose stars carefully:

- Surface temp & gravity
- Brighter than 15th mag
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# Define the Stellar Domain: *Stellar Parameters and SNR of Transit*

## Stellar Domain: FGK Main Sequence

$$T_{\text{eff}} = 4100 - 6100 \text{ K}$$

$$\log g = 4.0 - 4.9$$

$$\text{Kepmag} < 15 \text{ mag}$$



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**Note:**

**Only 59,000 Kepler Target stars meet these stellar criteria**

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SNR Threshold of Transit: 10

Demand  $\text{SNR} > 10$  in Quarter 3 alone

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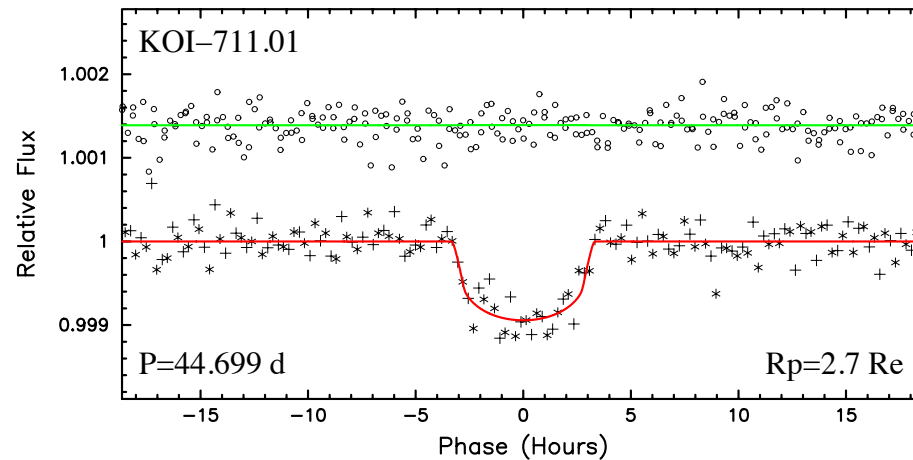
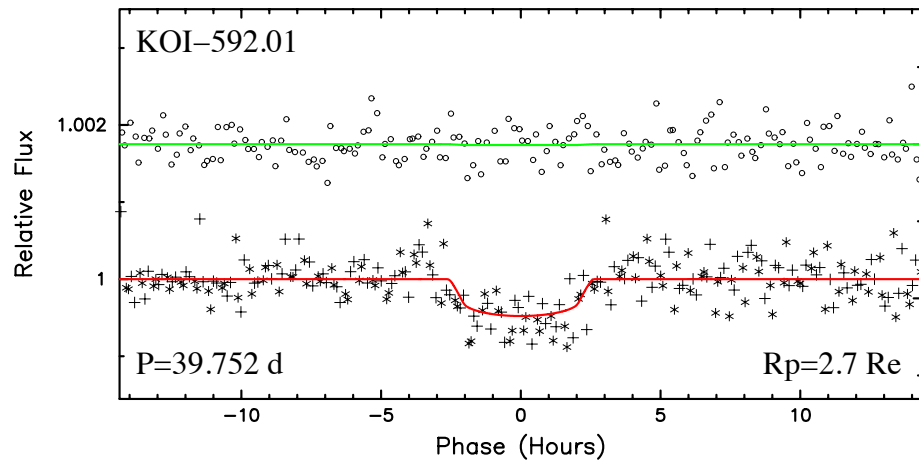
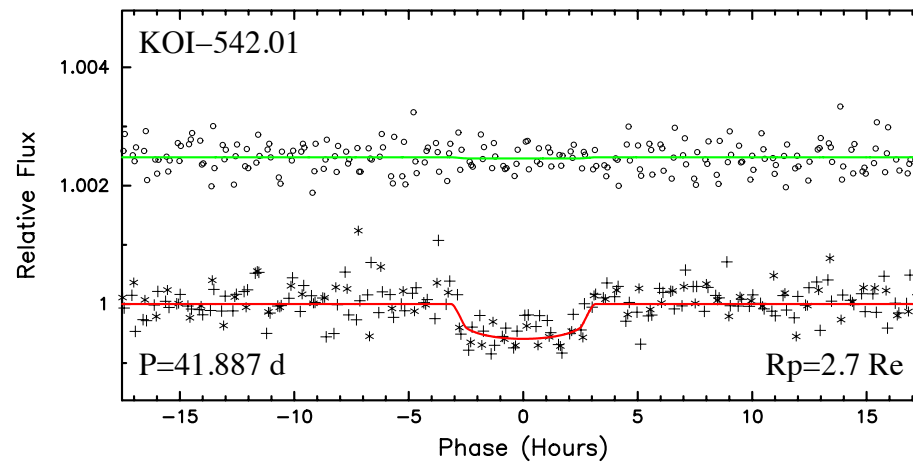
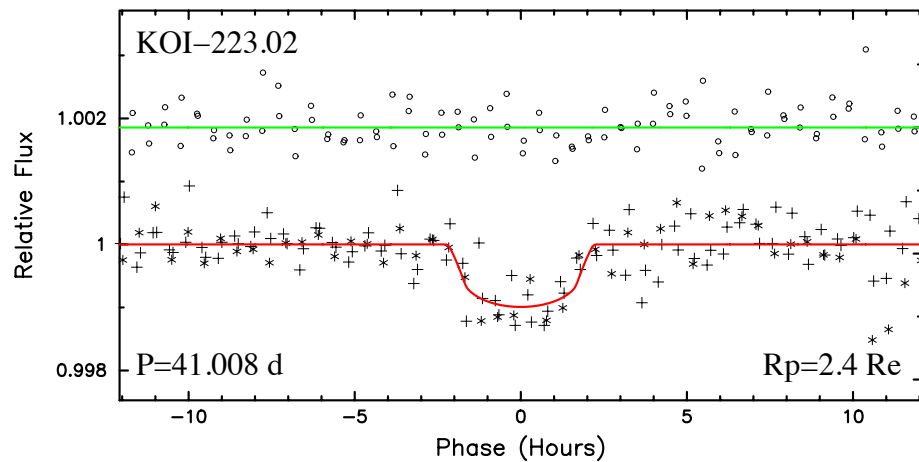
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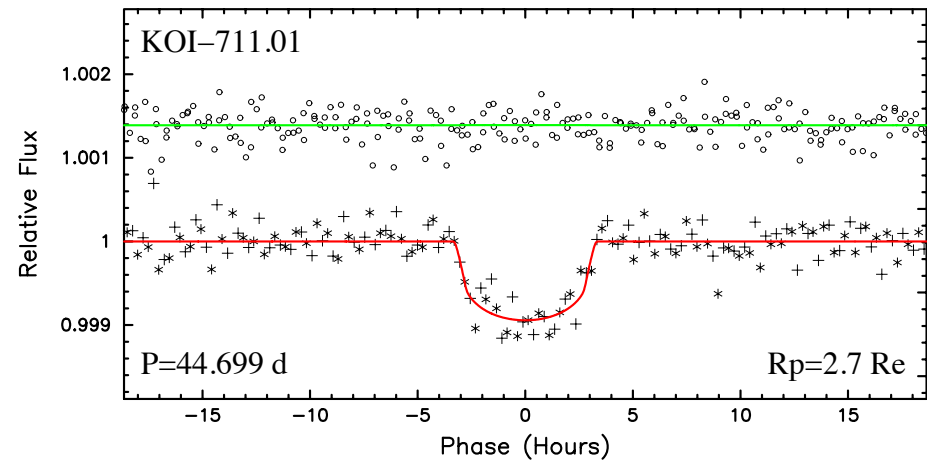
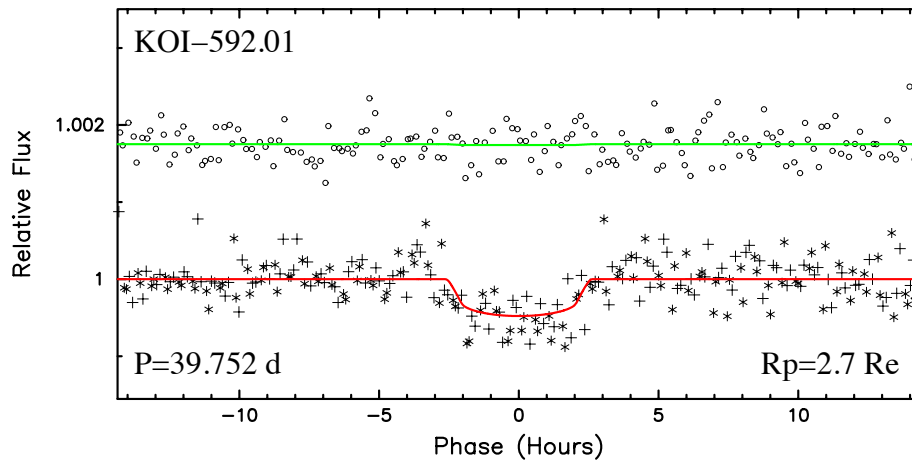
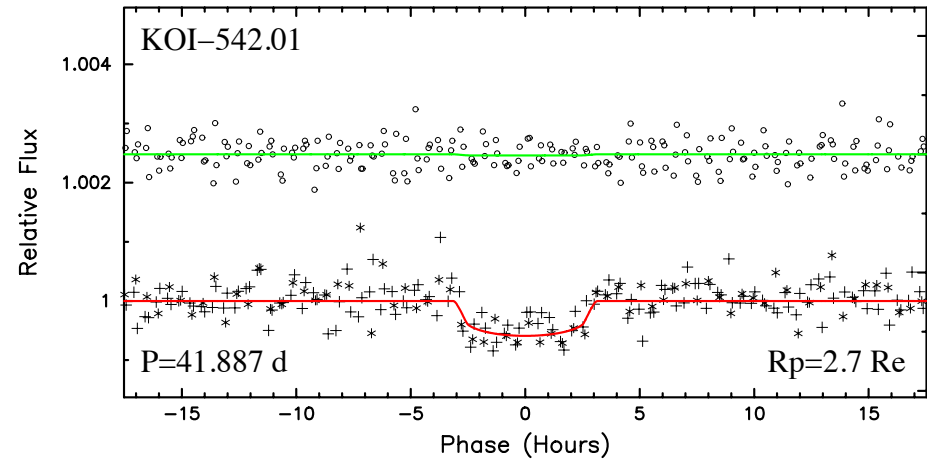
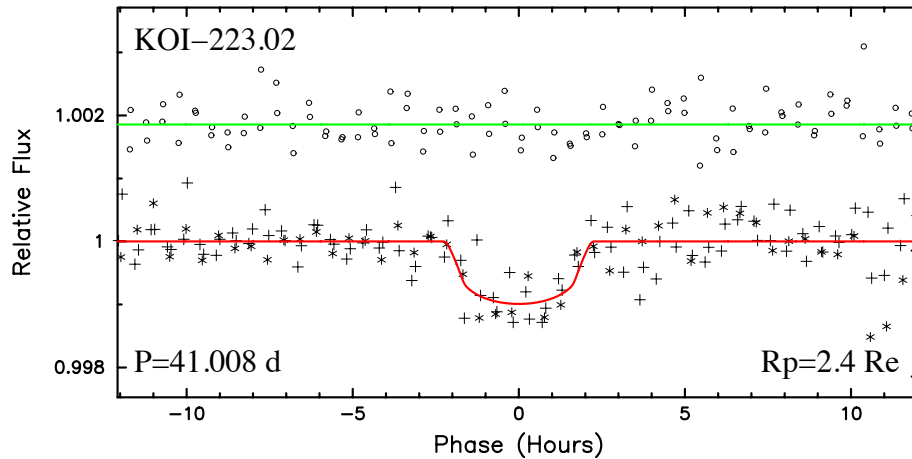
SNR Depends on

- planet radius
- # of transits
- Photometric noise

# Kepler Transits with SNR $\approx 10$



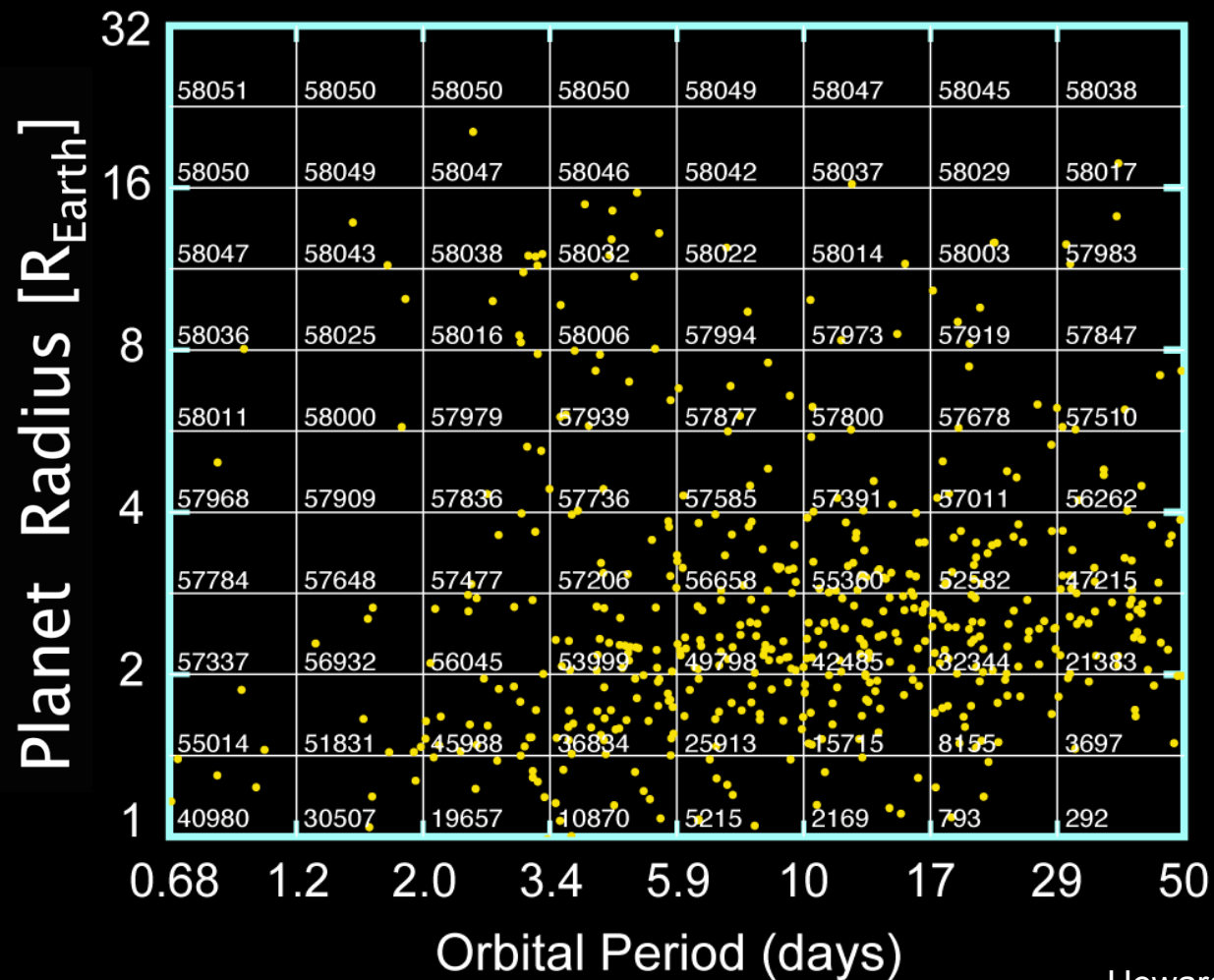
# Kepler Transits with SNR $\approx 10$



SNR=10: Sound Detections; Few missed.  
Low False Alarms; High Completeness

# Number of Target Stars Capable of Achieving SNR > 10 in Quarter 3

**Target Star Parameters:**  $T_{\text{eff}}=4100\text{--}6100\text{ K}$ ,  $\log g=4.0\text{--}4.9$ ,  $\text{Kepmag}<15$



# Define Planet Occurrence

For each  $R_{pL}$  and Period:

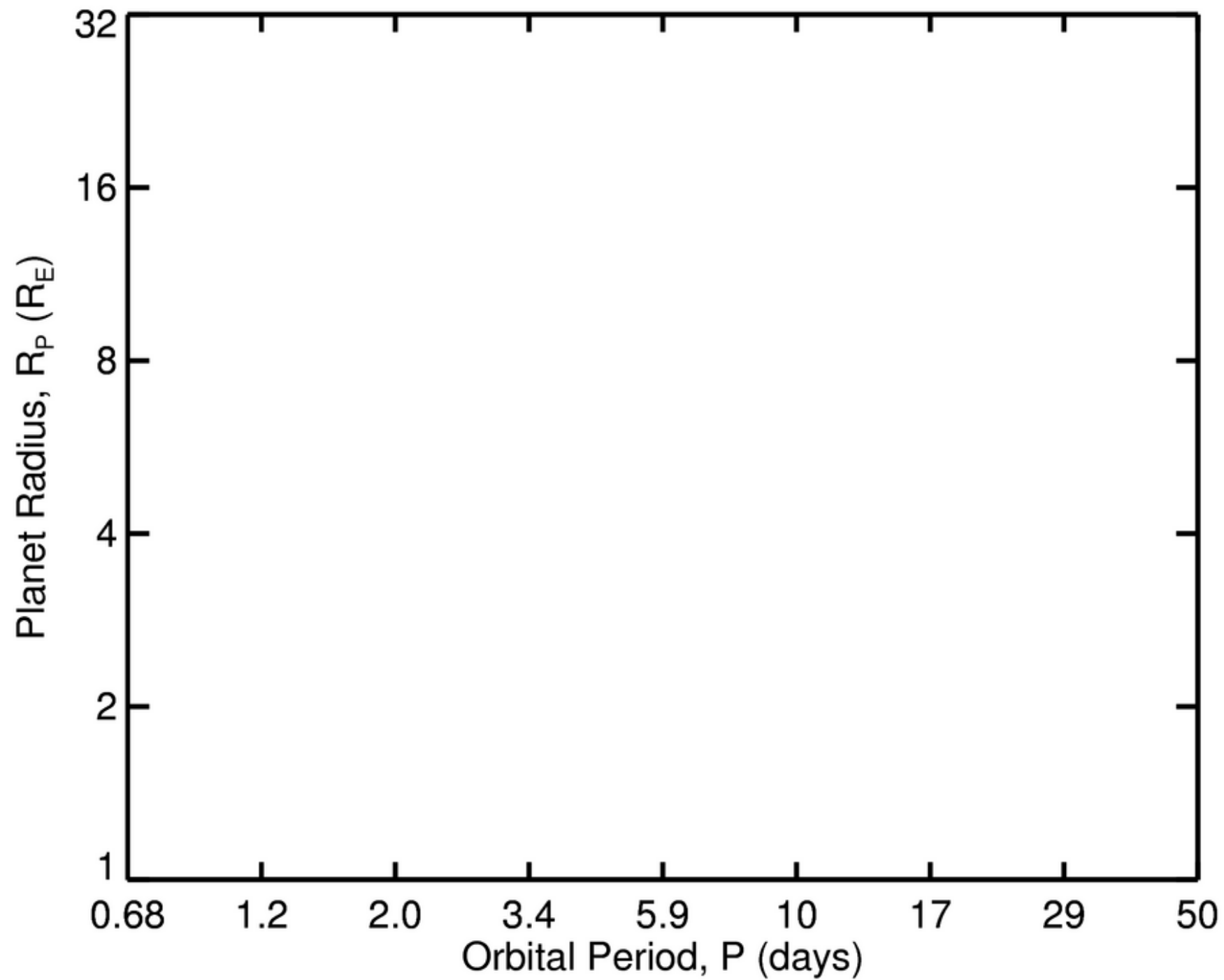
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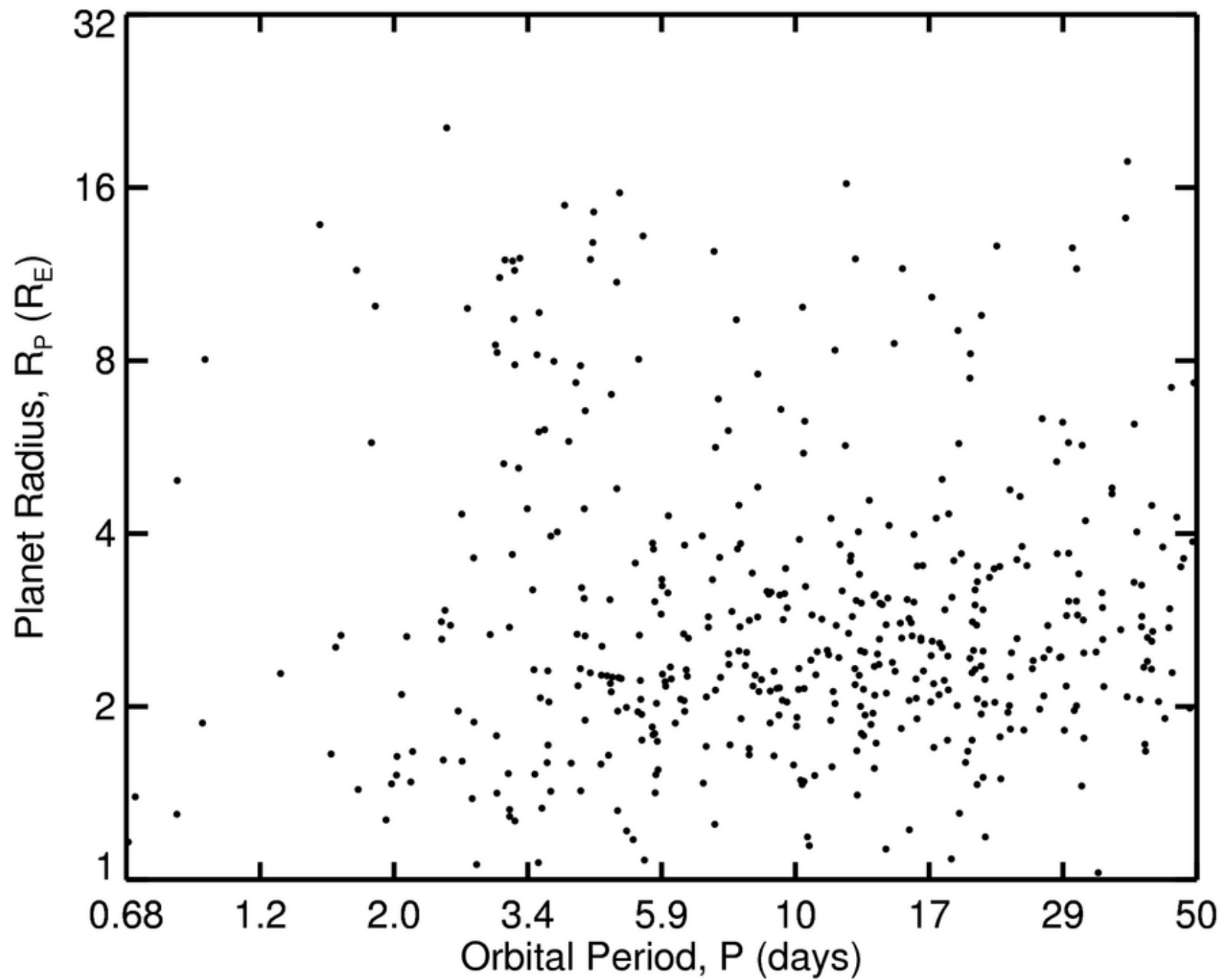
$$\text{Occurrence} = \frac{\# \text{ planets}}{\# \text{ stars}}$$

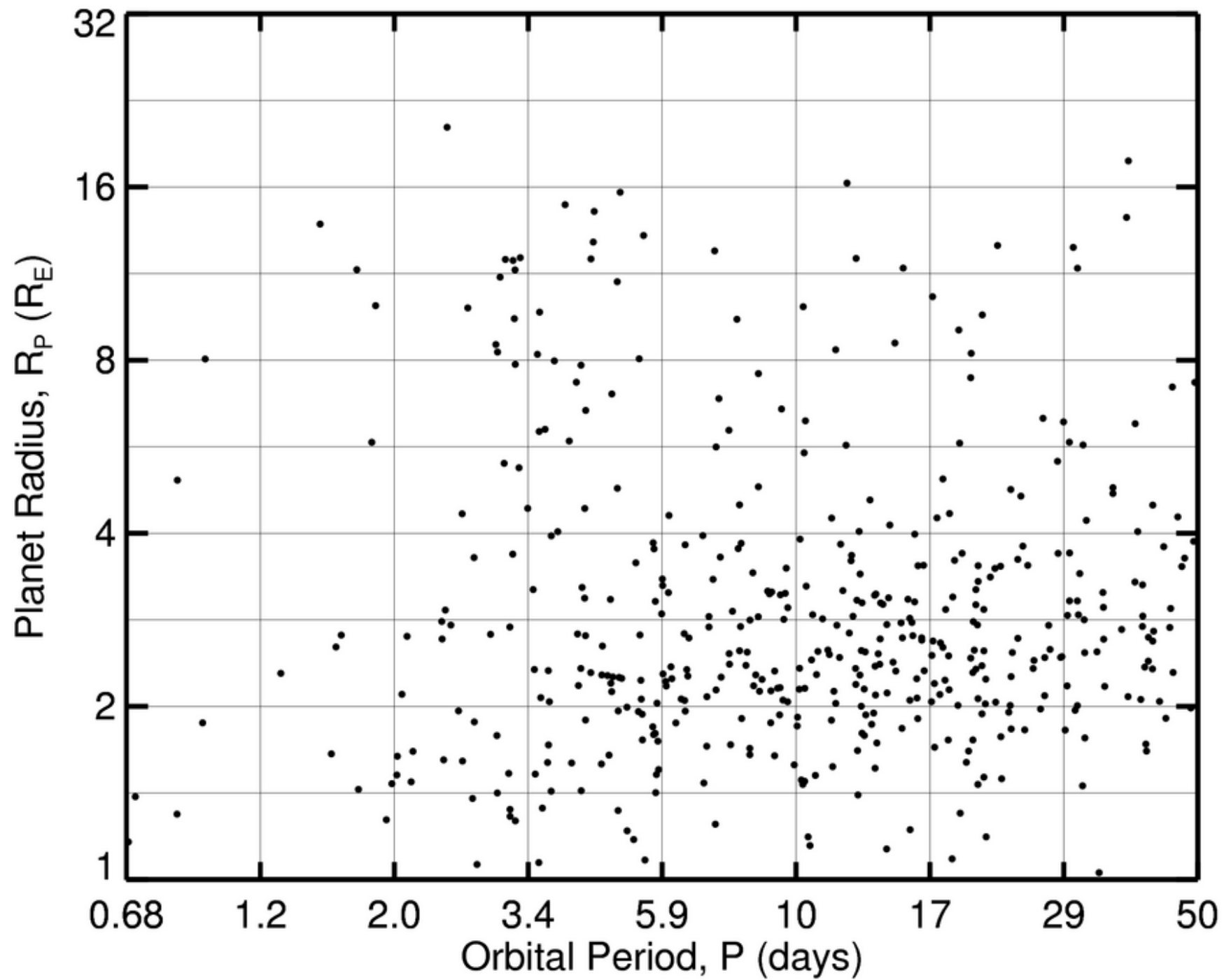
Choose stars carefully:

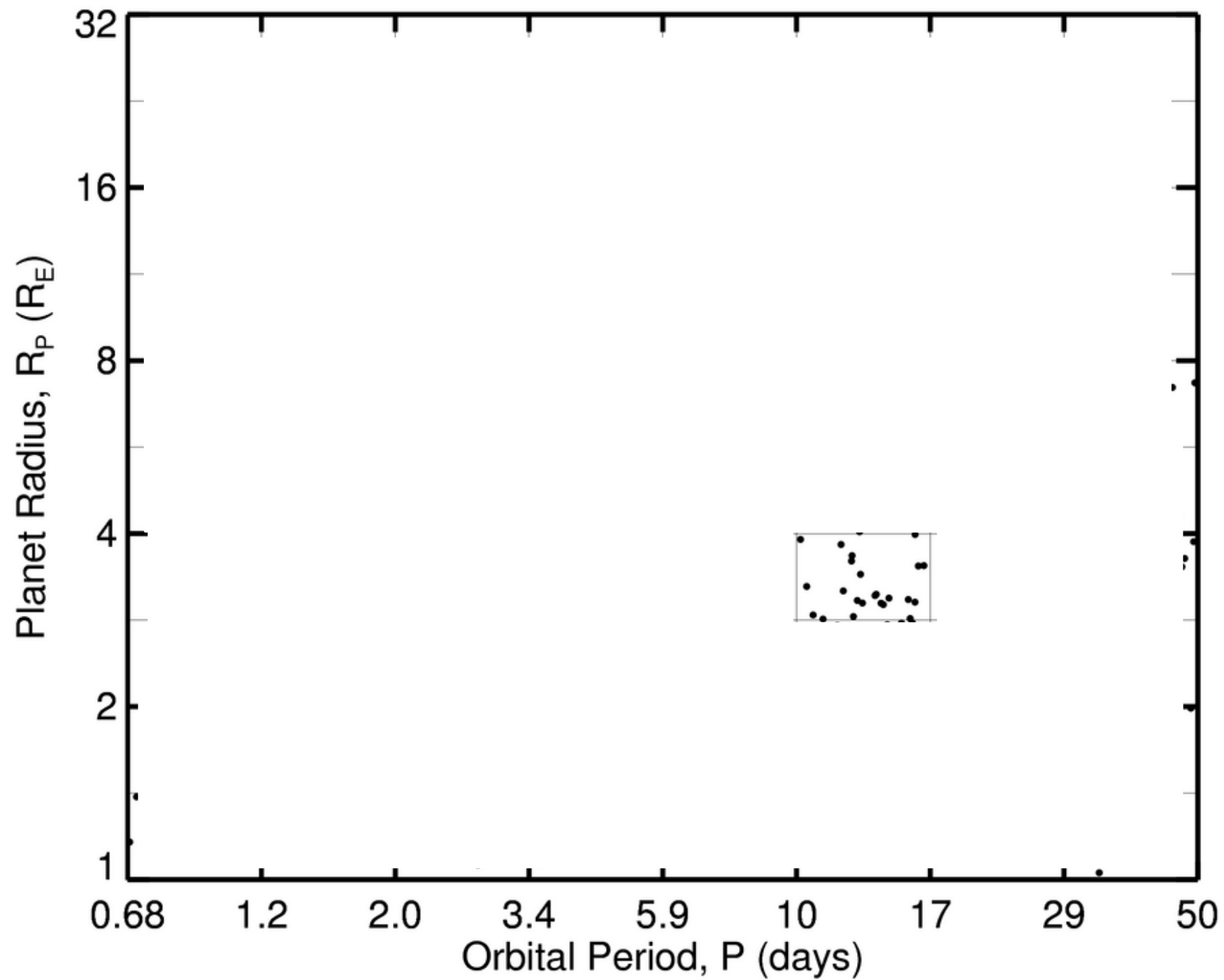
- Surface temp & gravity
- Brighter than 15th mag
- Signal/noise > 10

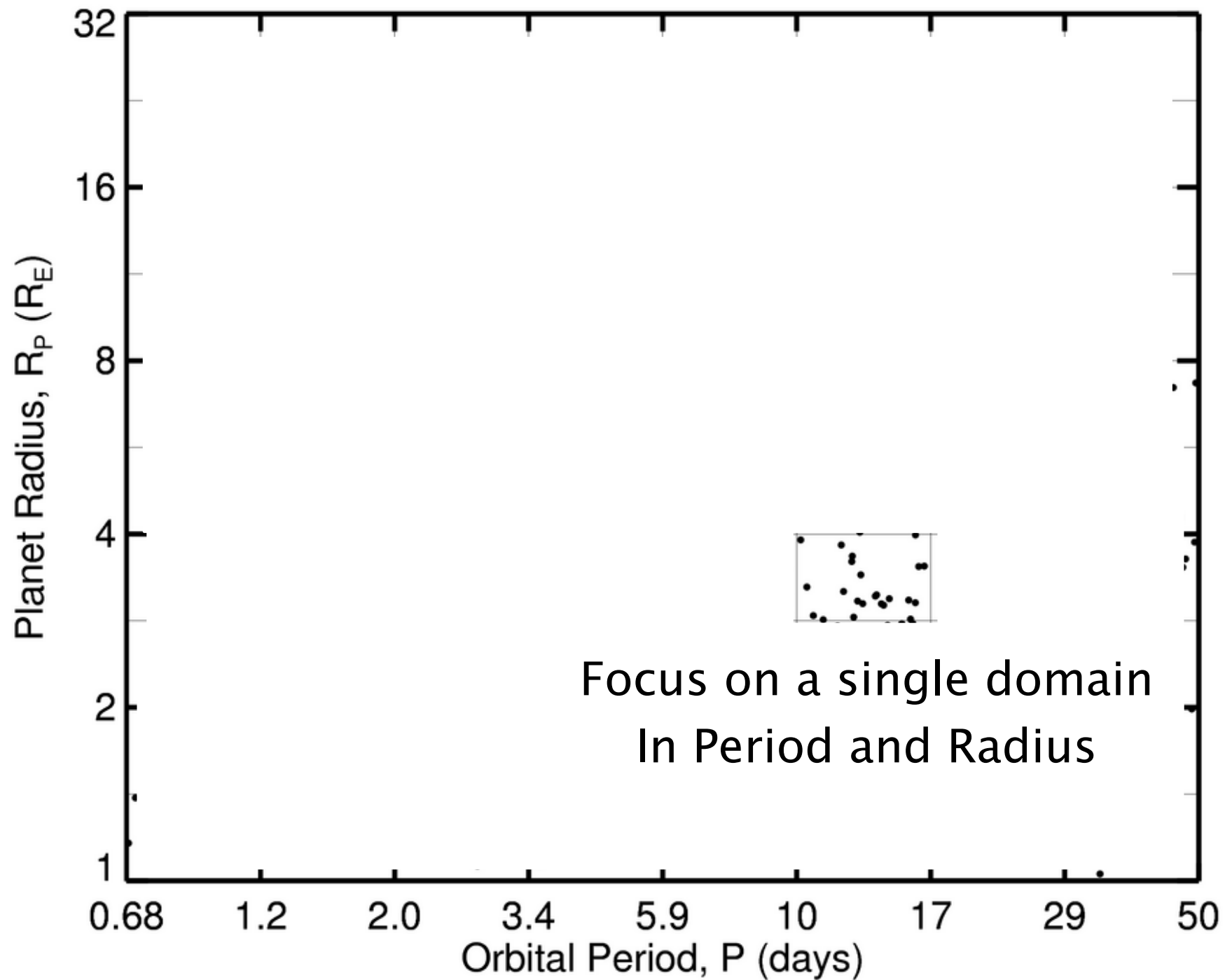


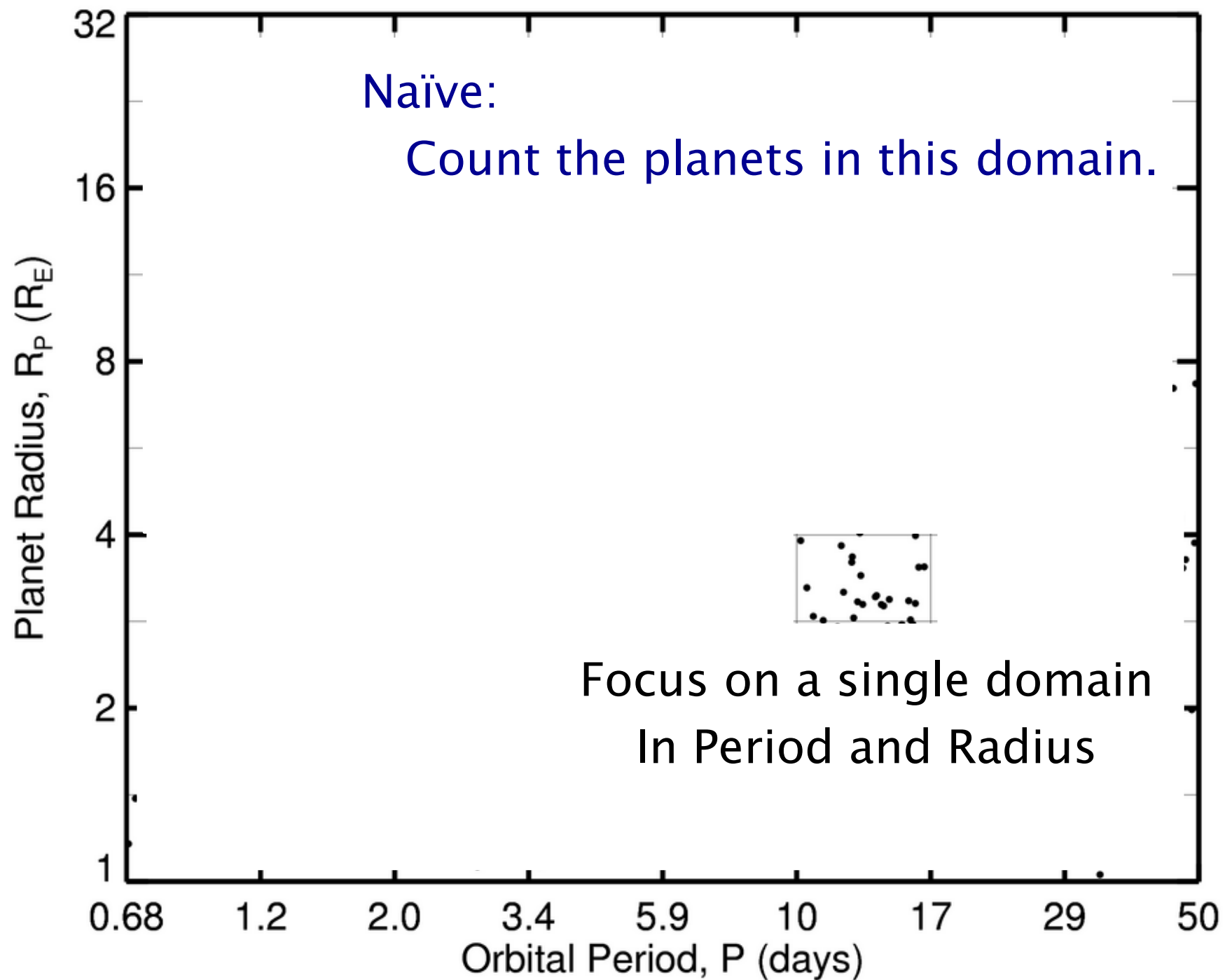


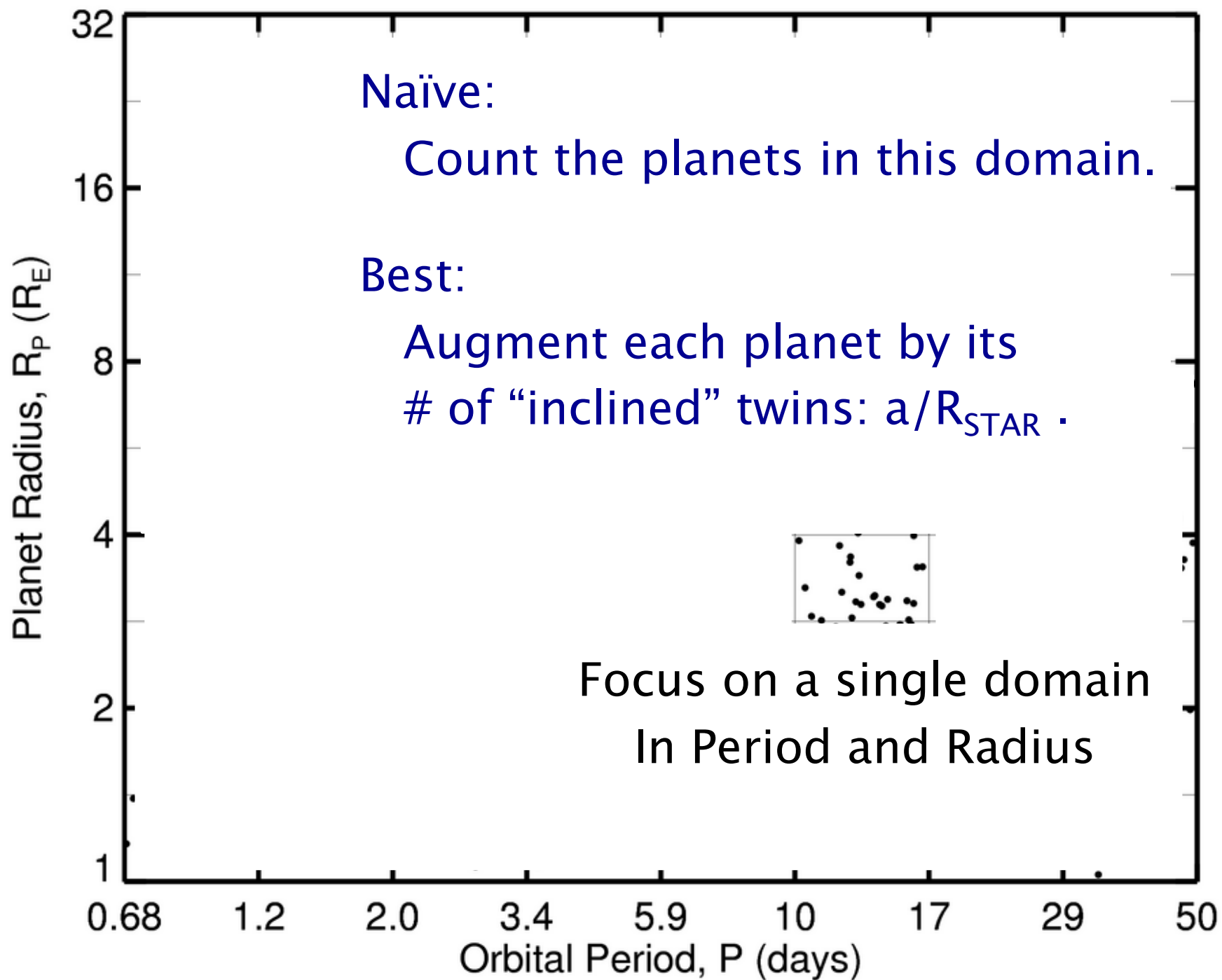




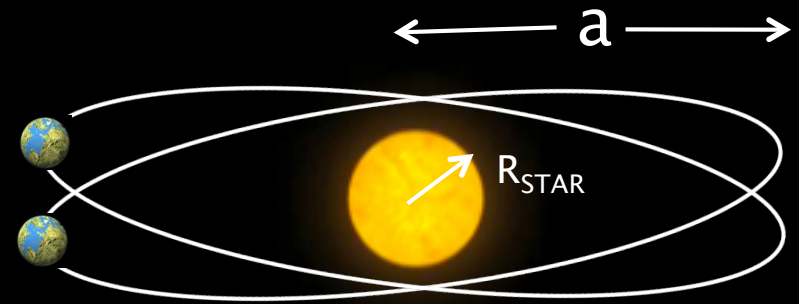
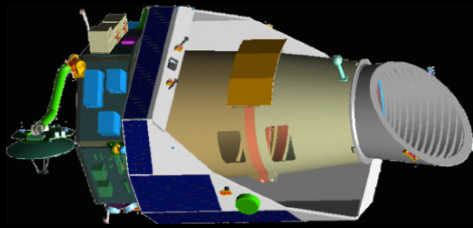




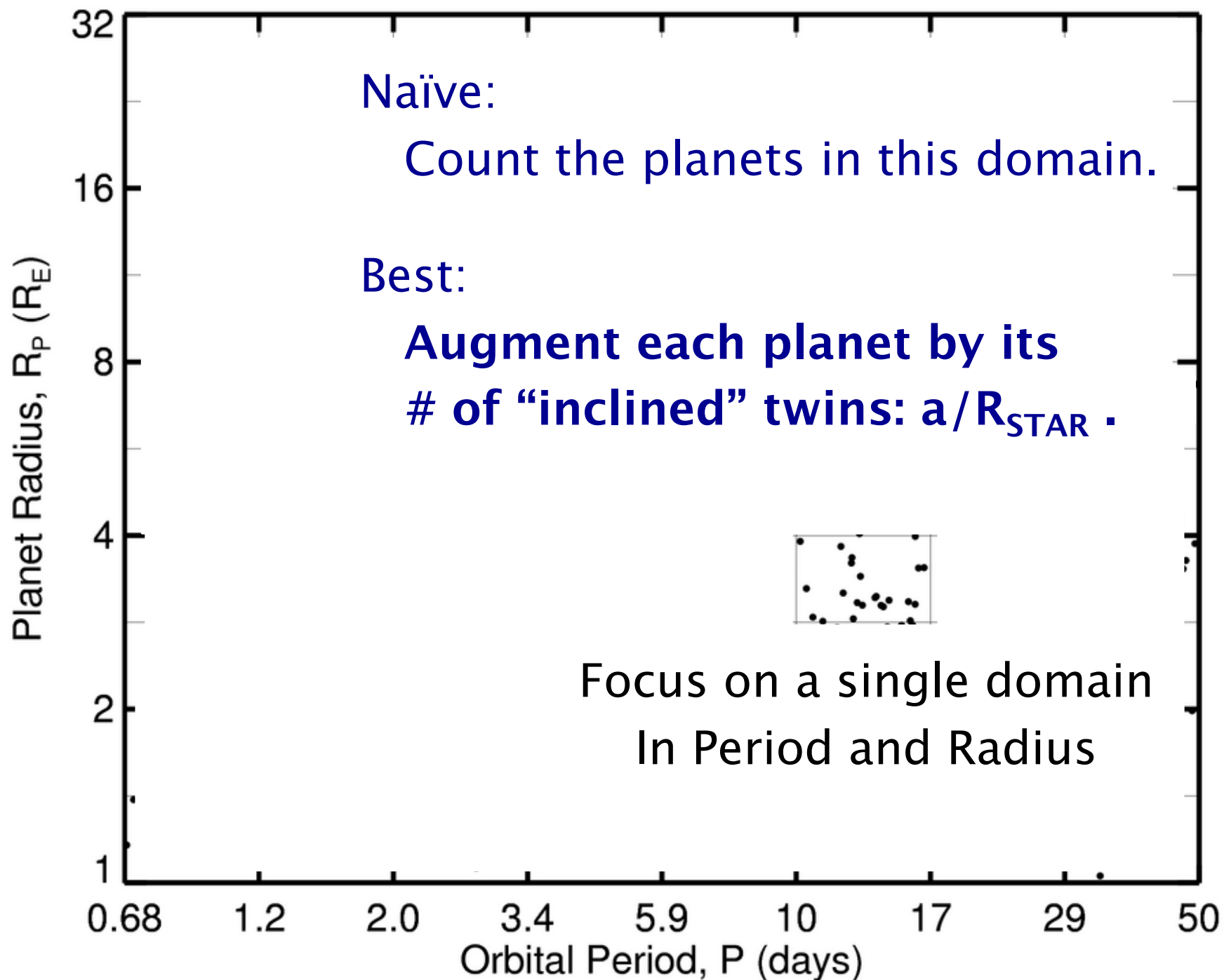




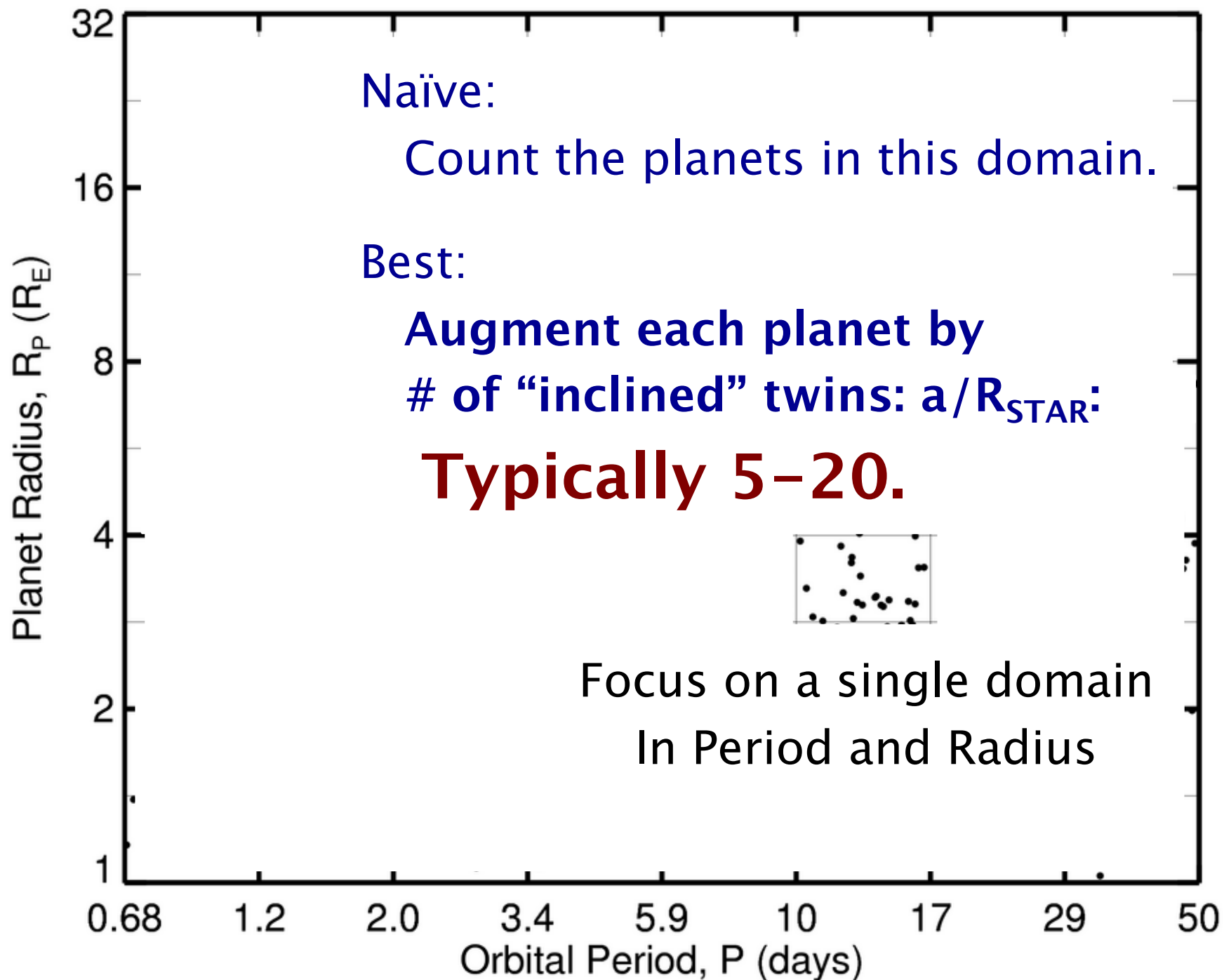
# Augment Each Transiting Planet by the # of (undetected) Inclined Twins



$$\# \text{ Planets at } \underline{\text{All Inclinations}} = a / R_{\text{STAR}}$$







# Define Planet Occurrence

within each cell:

$$\text{Occurrence} = \frac{\# \text{ planets}}{\# \text{ stars}}$$

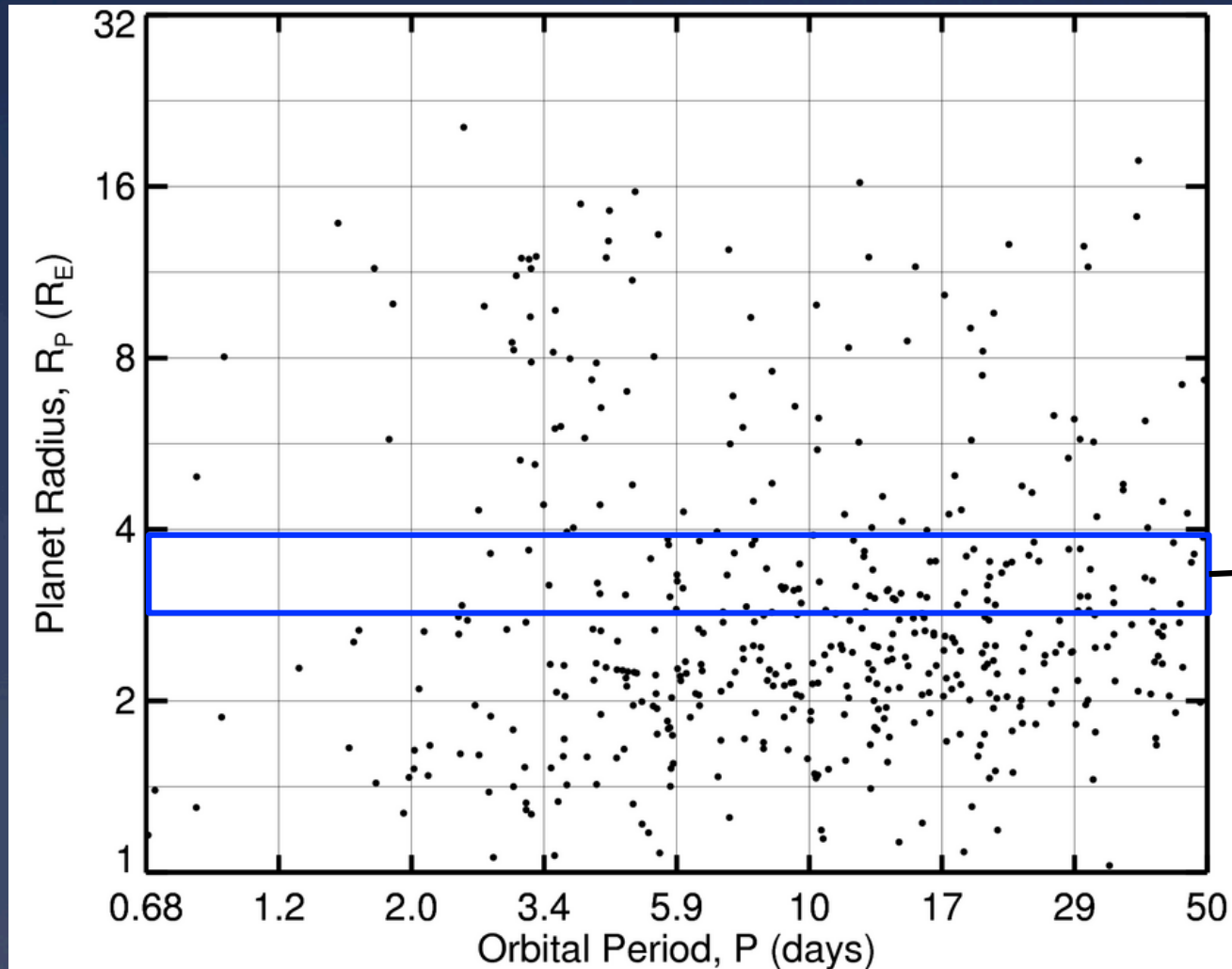
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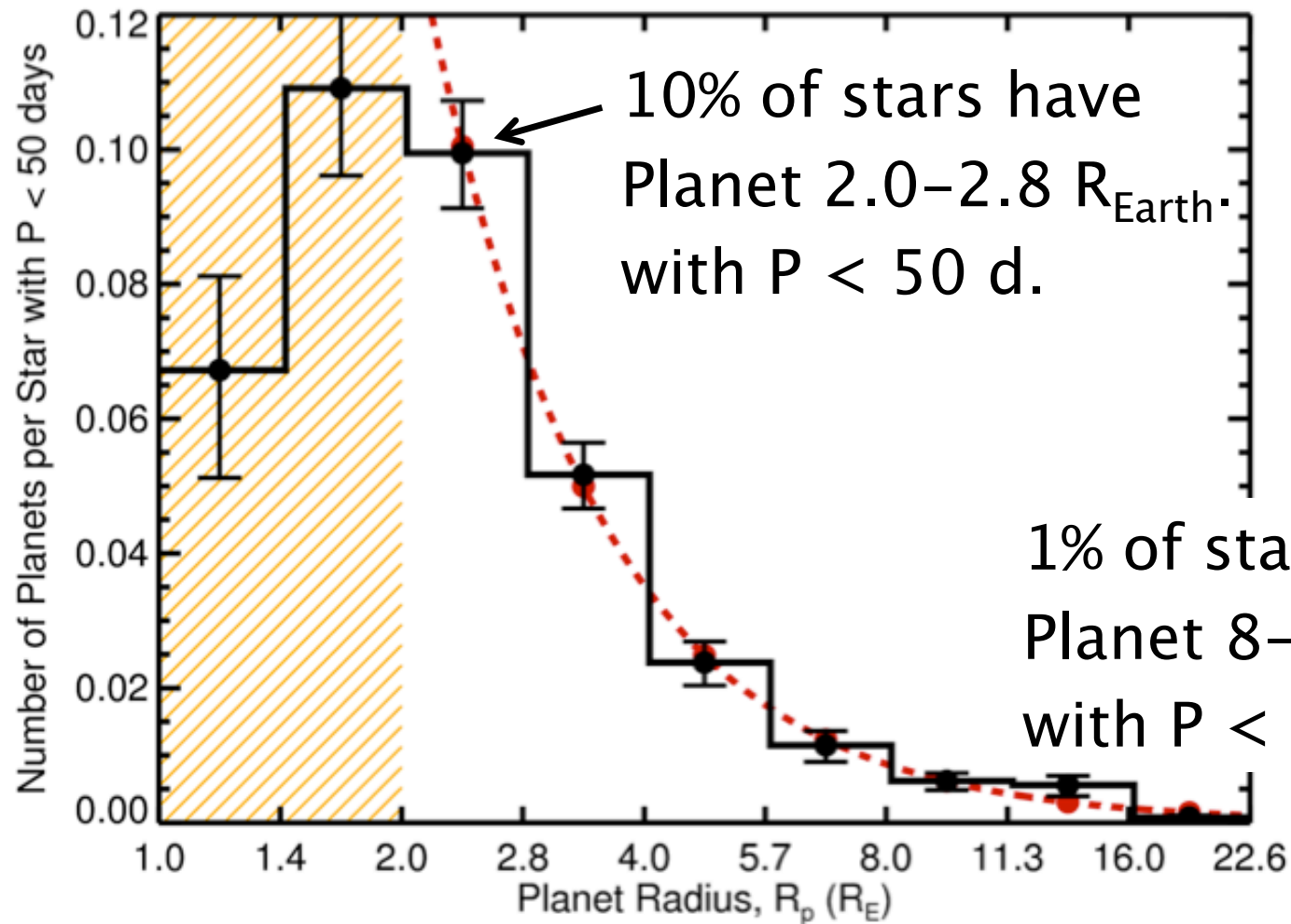
# Compute Occurrence vs. Planet Radius



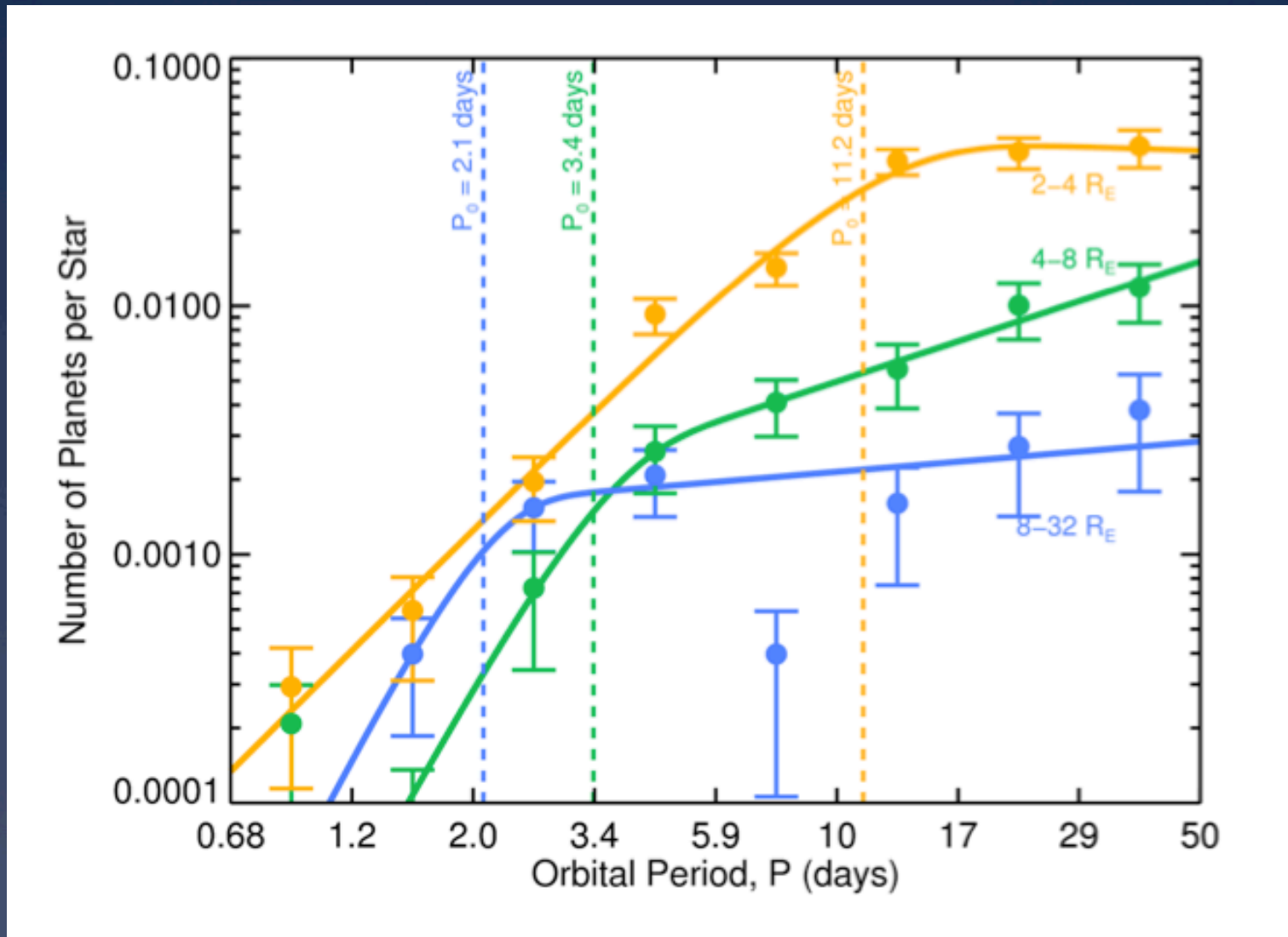
Sum  
Occurrence  
over all  
Periods

# Distribution of Planet Radii

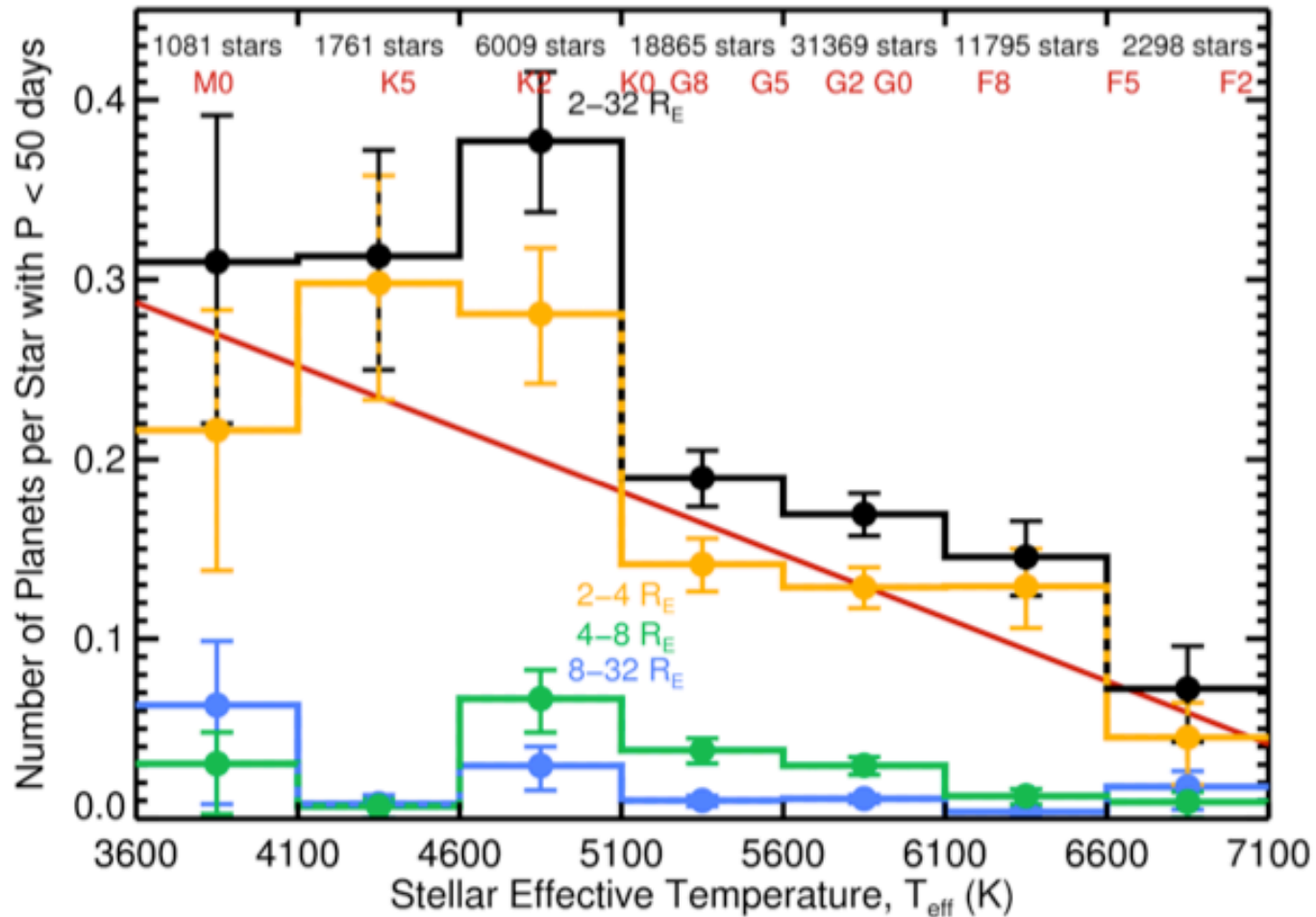
For Orbital Periods < 50 Days



# Planet Occurrence vs. Orbital Period

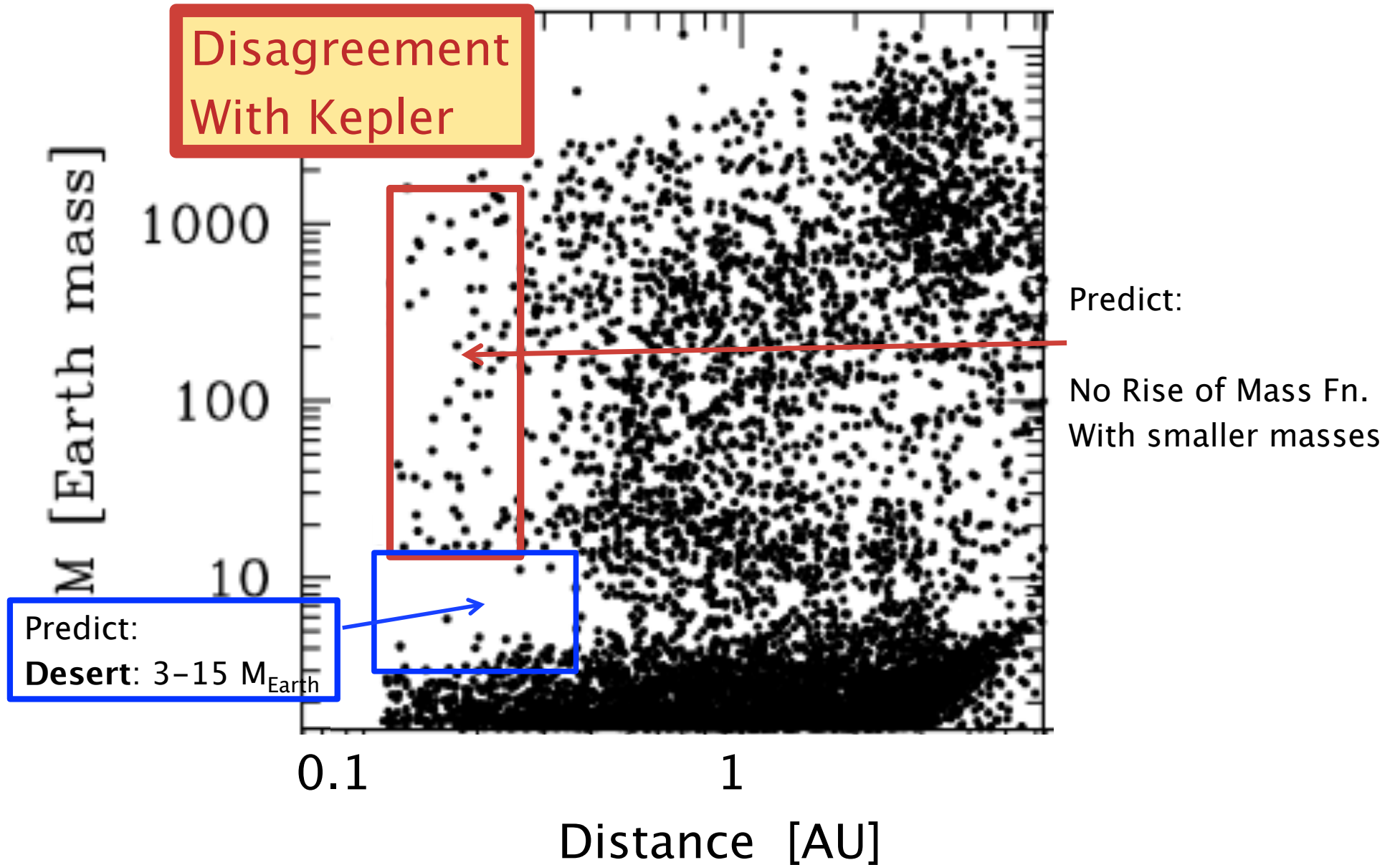


# Planet Occurrence vs. Stellar $T_{\text{eff}}$



# Extrasolar planet population synthesis

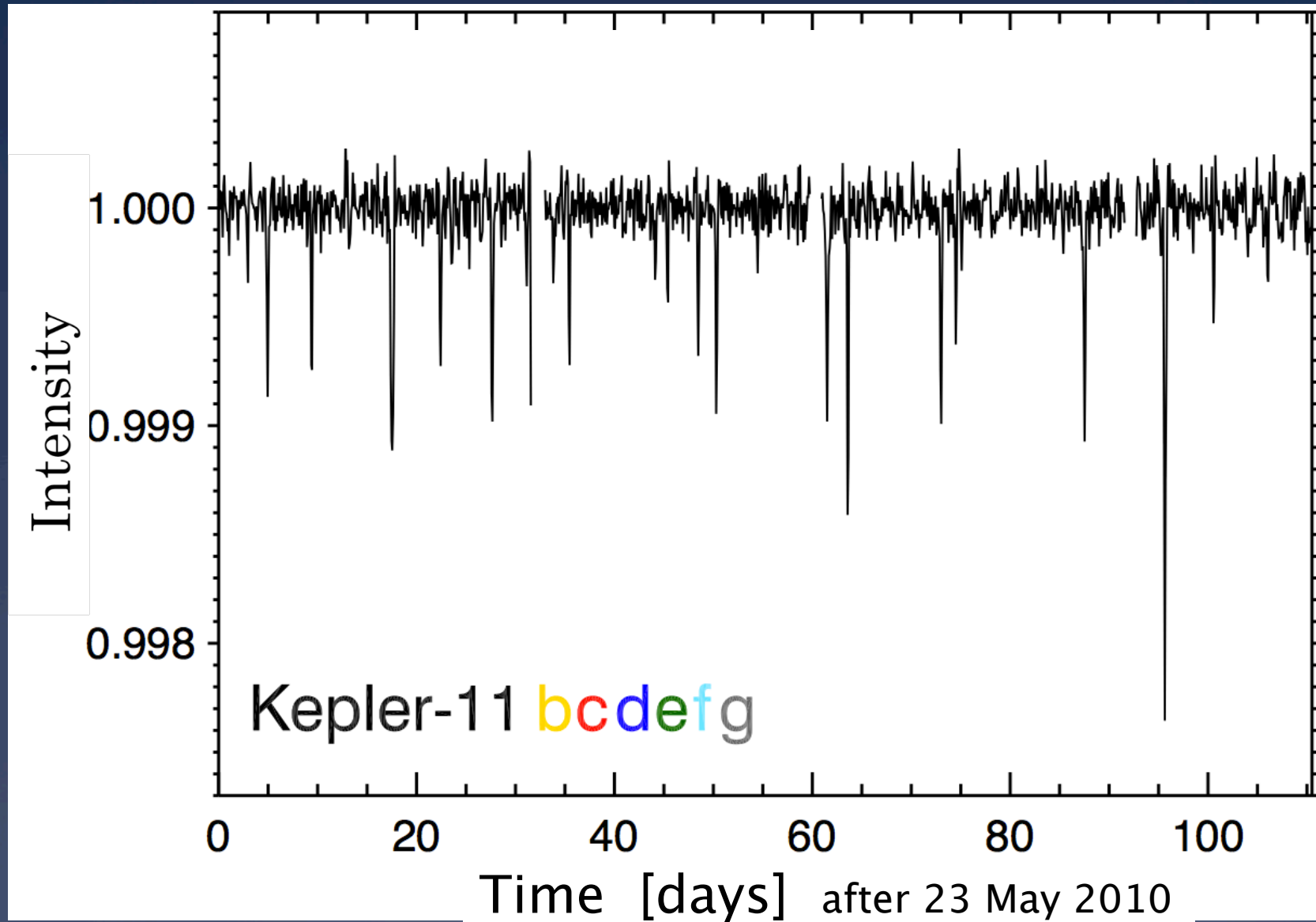
Lin & Ida (2010); Alibert, Mordasini, Benz (2011)



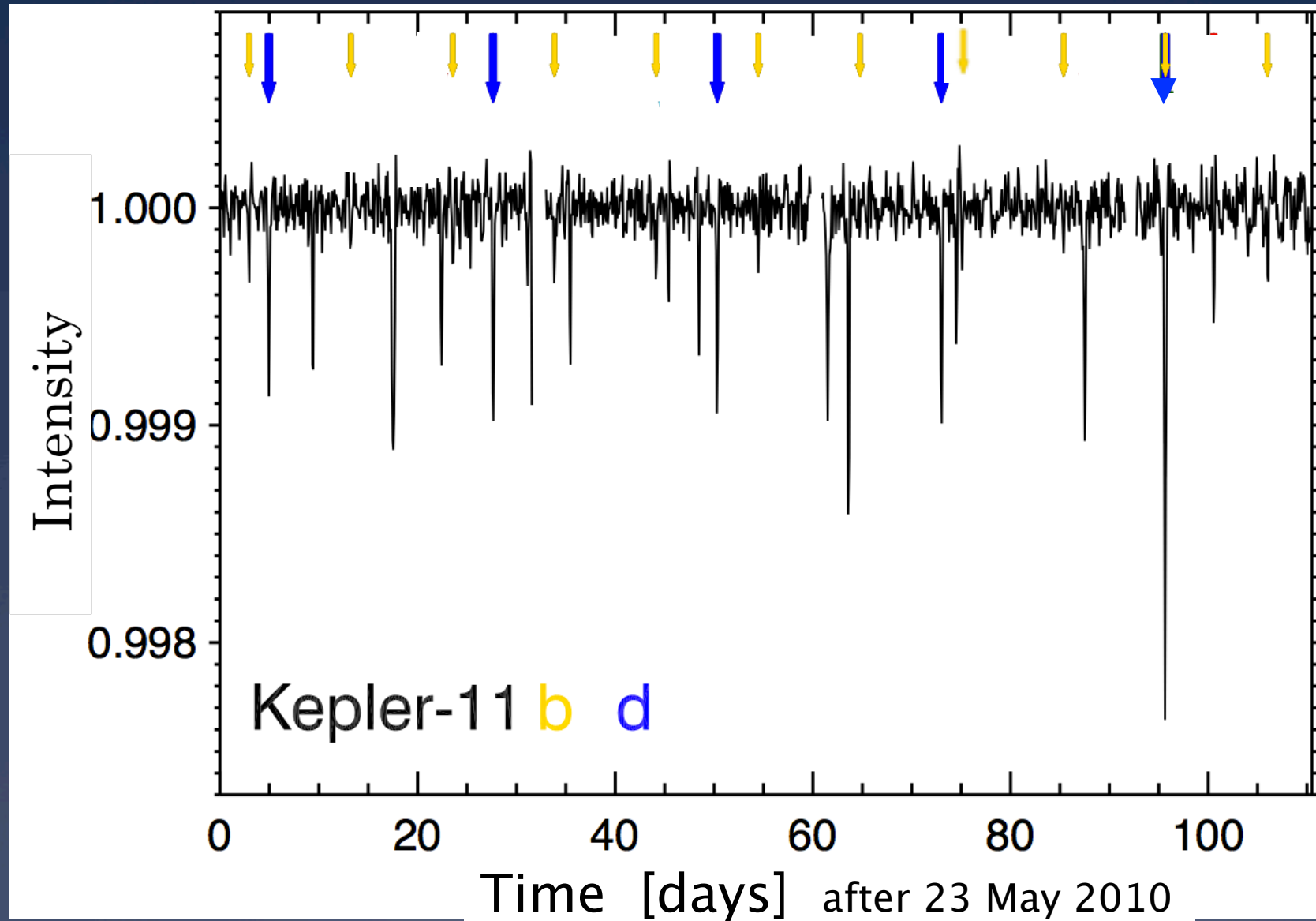
# Systems with Multiple Transiting Planets



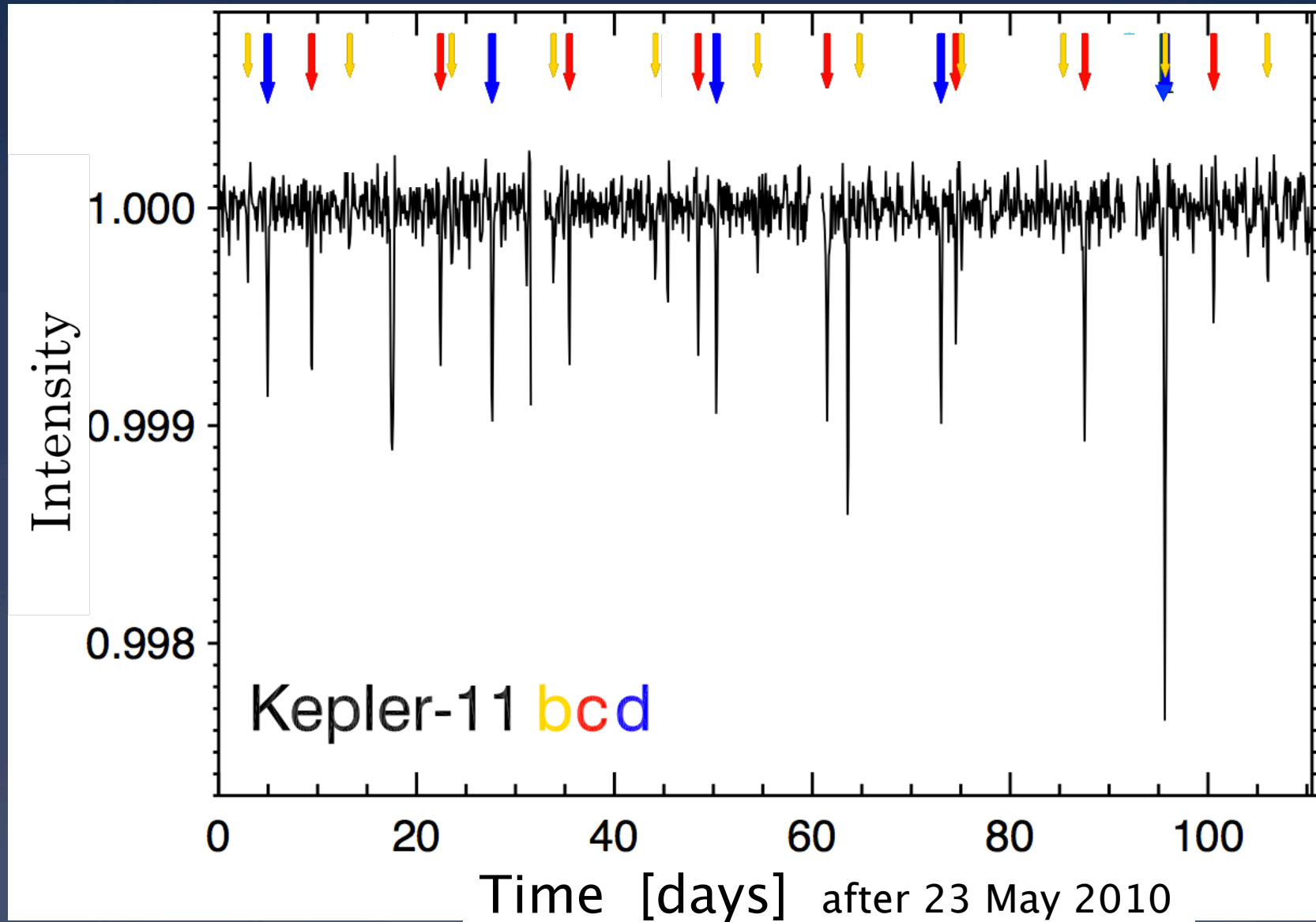
# Kepler-11: Six Transiting Planets



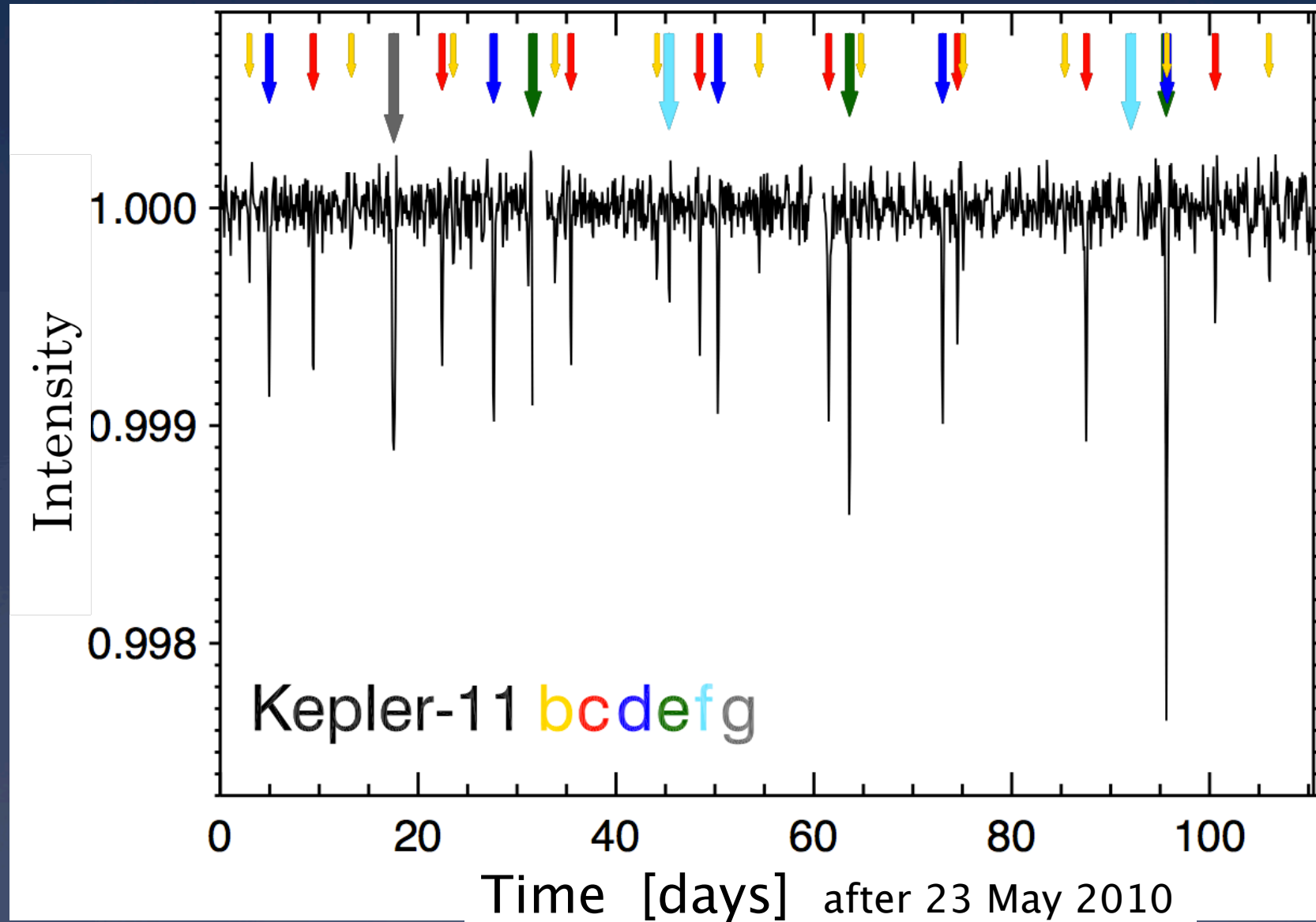
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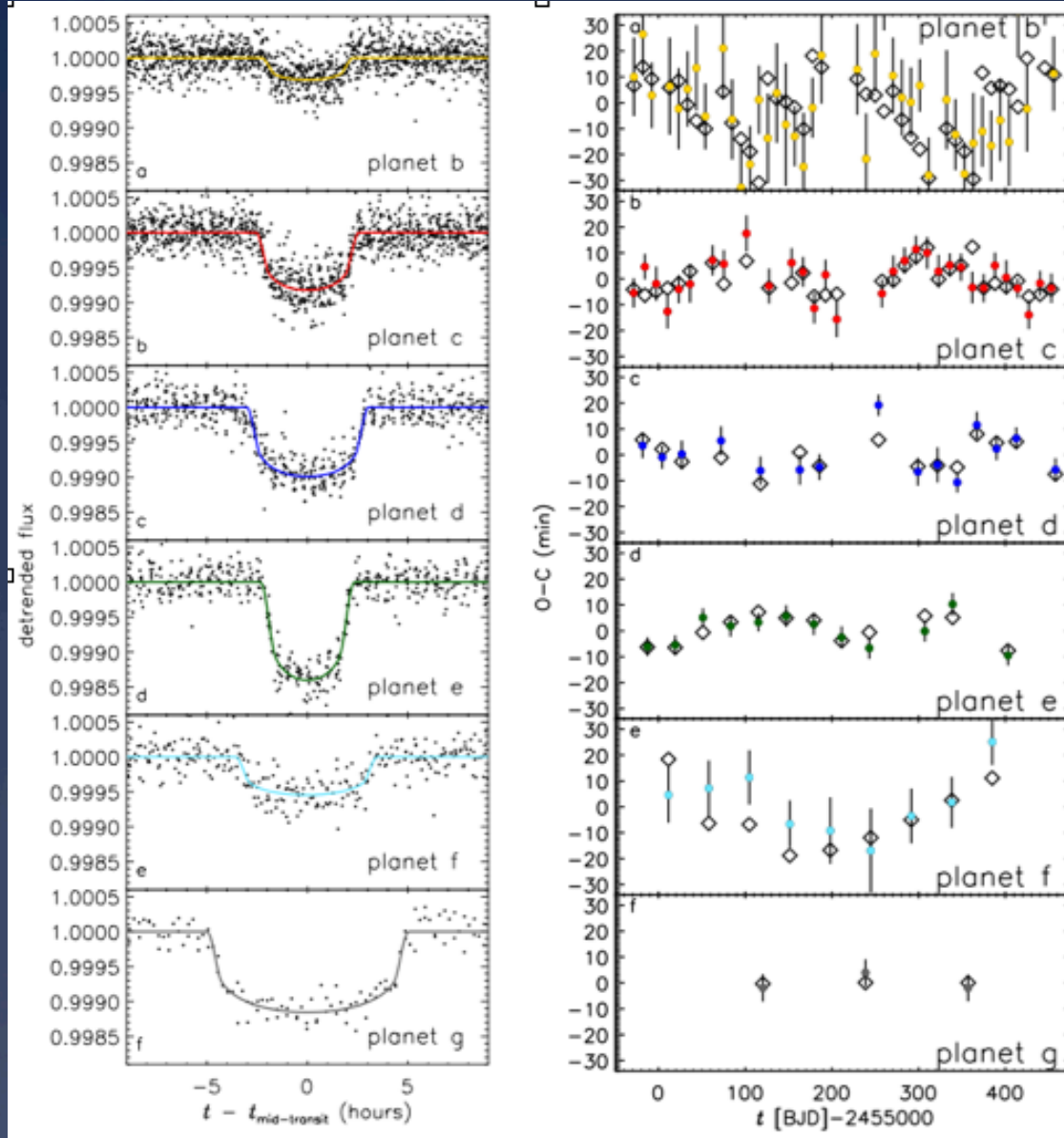


# Transit-Timing Variations:



Transits

Time: Lead or Lag

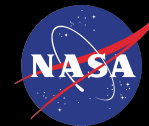


Transit-Time  
Variations due  
to planet-planet  
Interactions:

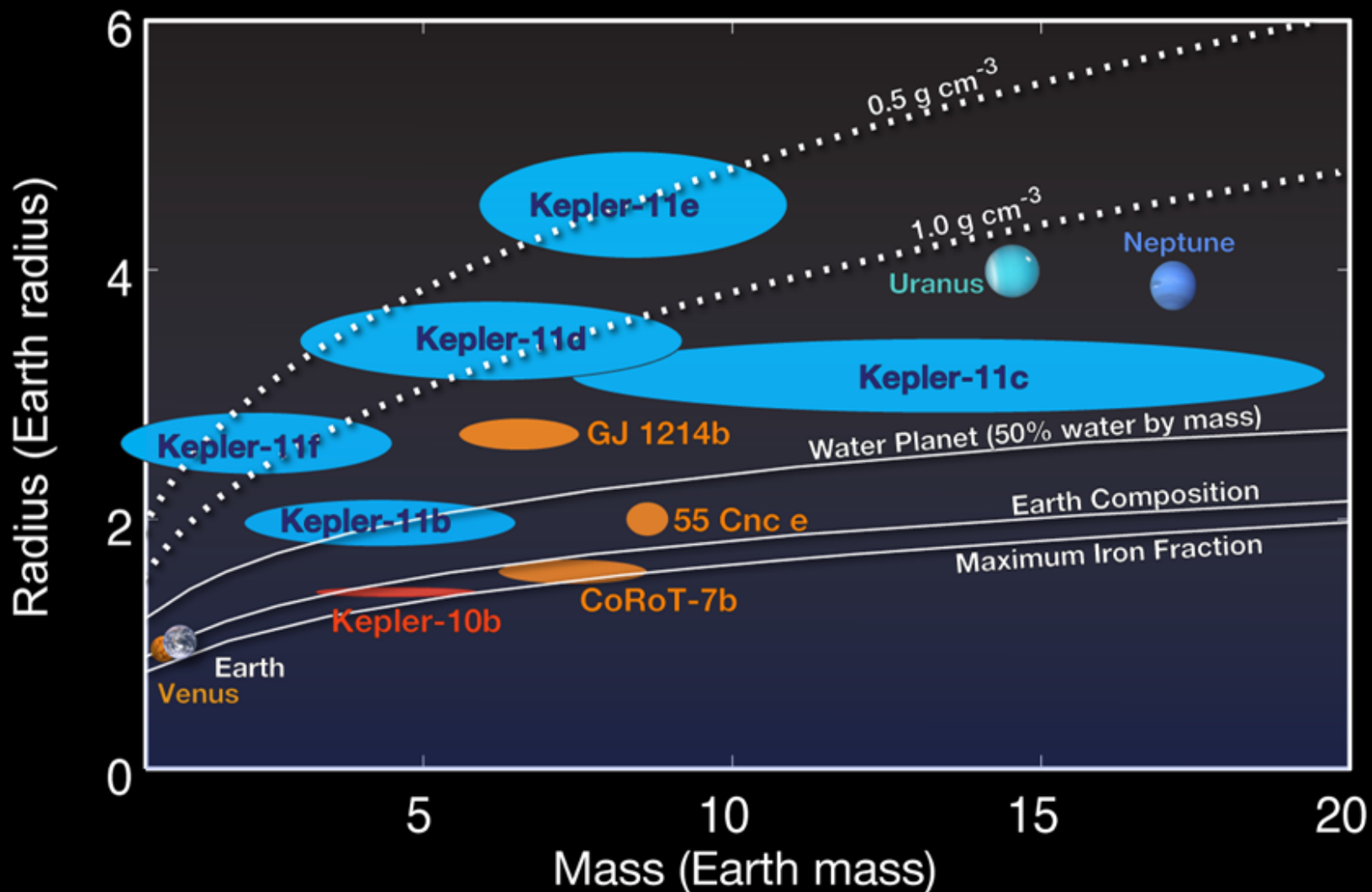
**Planet Masses**

# Kepler-11 parameters

Planet	Period (days)	Radius ( $R_{\oplus}$ )	Mass ( $M_{\oplus}$ )	Density ( $\text{g/cm}^3$ )
b	<b>10.30375</b>	<b>1.97</b>	<b>4.3</b>	<b>3.1</b>
	$\pm 0.00016$	$\pm 0.19$	+2.2,-2.0	+2.1,-1.5
c	<b>13.02502</b>	<b>3.15</b>	<b>13.5</b>	<b>2.3</b>
	$\pm 0.00008$	$\pm 0.30$	+4.8,-6.1	+1.3,-1.1
d	<b>22.68719</b>	<b>3.43</b>	<b>6.1</b>	<b>0.9</b>
	$\pm 0.00021$	$\pm 0.32$	+3.1,-1.7	+0.5,-0.3
e	<b>31.99590</b>	<b>4.52</b>	<b>8.4</b>	<b>0.5</b>
	$\pm 0.00028$	$\pm 0.43$	+2.5,-1.9	+0.2,-0.2
f	<b>46.68876</b>	<b>2.61</b>	<b>2.3</b>	<b>0.7</b>
	$\pm 0.00074$	$\pm 0.25$	+2.2,-1.2	+0.7,-0.4
g	<b>118.37774</b>	<b>3.66</b>		-
	$\pm 0.00112$	$\pm 0.35$	< 300	

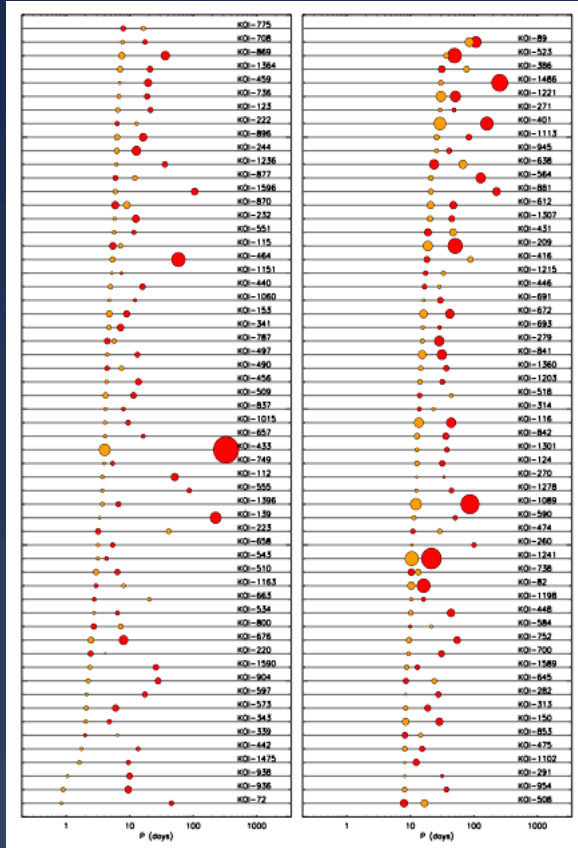


# Mass-Radius Diagram

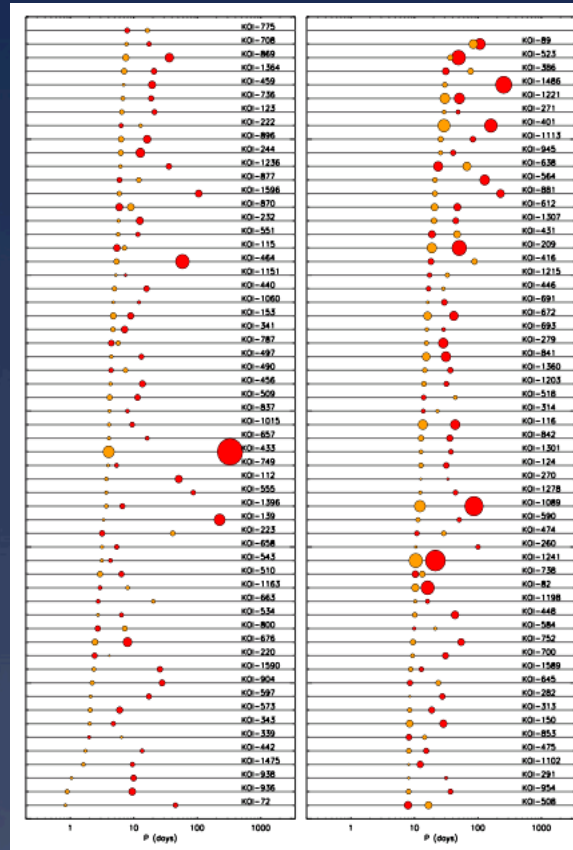


# Multi-Planet Candidate Systems (Sept. 2011)

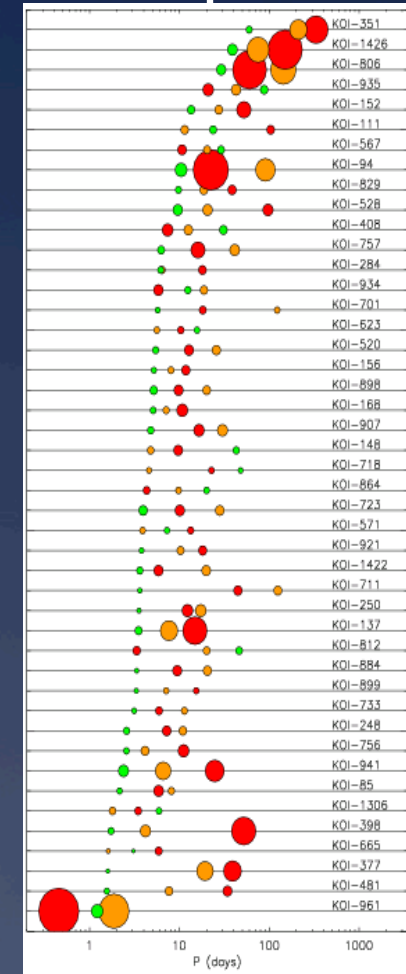
## Doubles



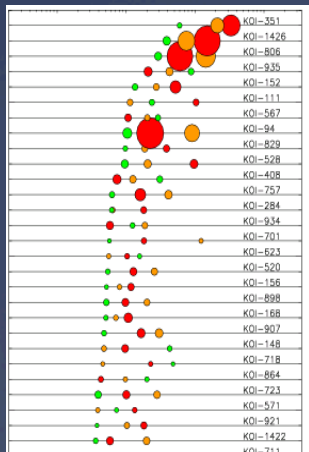
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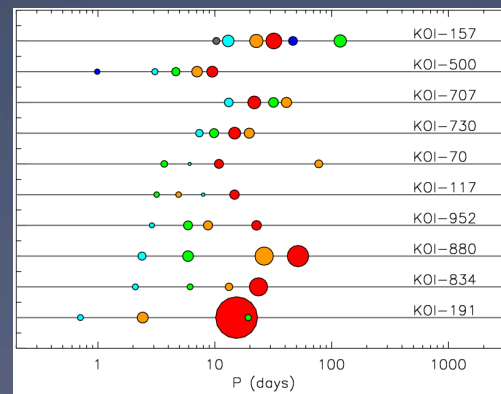
## Triples



## Quadruple

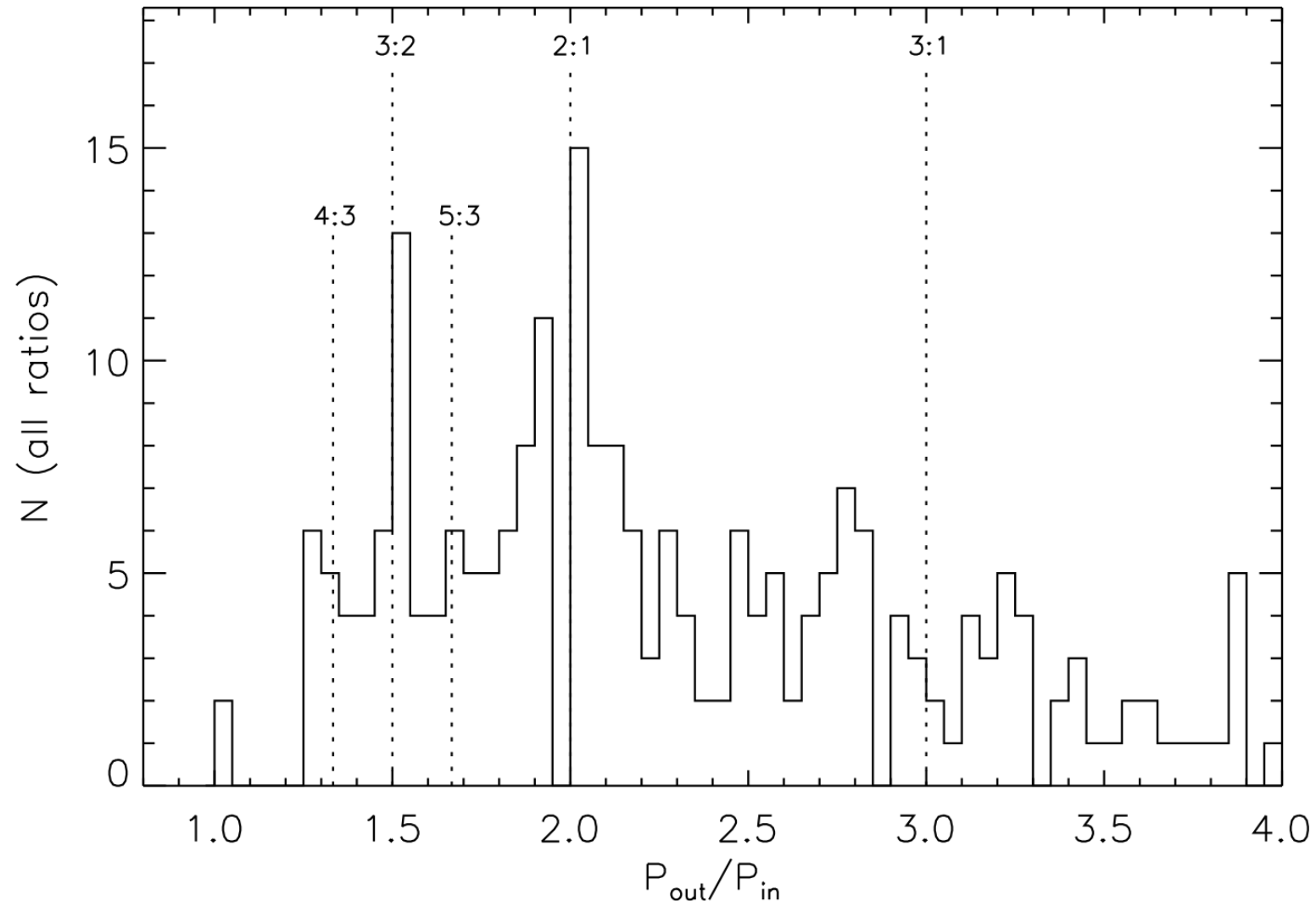


## Quintuple & Sextuple





# Resonance Preference



Dynamical analysis shows most near-MMR planets are NOT in MMR.  
Suggestion: Planets form and migrate into MMRs, but later  
are drawn out of MMR. Tides from spinning star? (Veras & Ford, submitted).

# Multiple Transiting Planets

# Planets	Feb 2011	Sept 2011
1	791	965
2	115	218
3	45	73
4	8	25
5	1	8
6	1	2

Prob of Transit is low:  $R_{\text{star}}/a \sim 0.05$

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Large ratios of doubles/singles and triples/doubles implies systematically co-planar orbits.

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- \* Architectures:
  - Flat Plane
  - Extremely compact
  - Multi-resonant

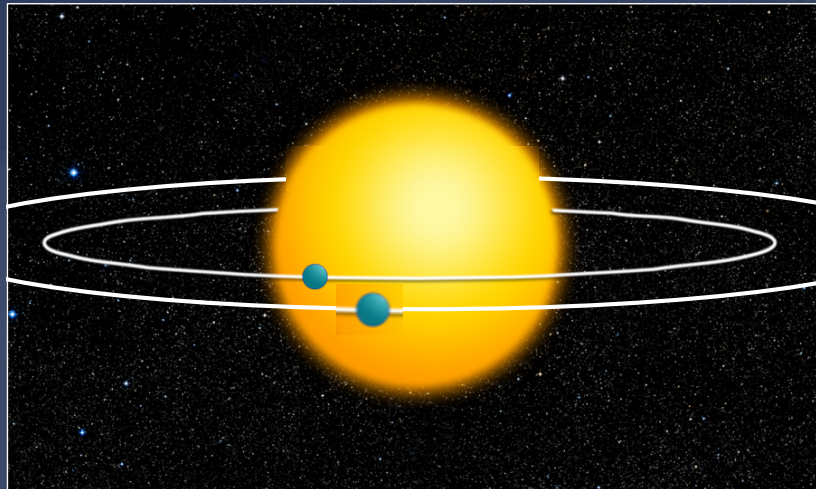
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- \* Mostly sub-Neptune size ( $R < 4 R_{\text{Earth}}$ )
- \* Architectures:
  - Flat Plane
  - Extremely compact
  - Multi-resonant
- \* Transit timing variations (TTV): Planet Masses

# Double Planets: Two Planets or

Double Transit signal could be due to:

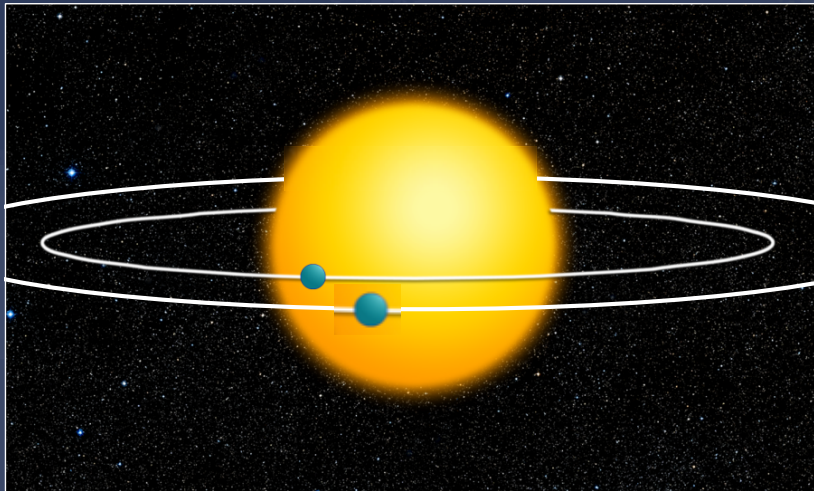
Two Transiting Planets



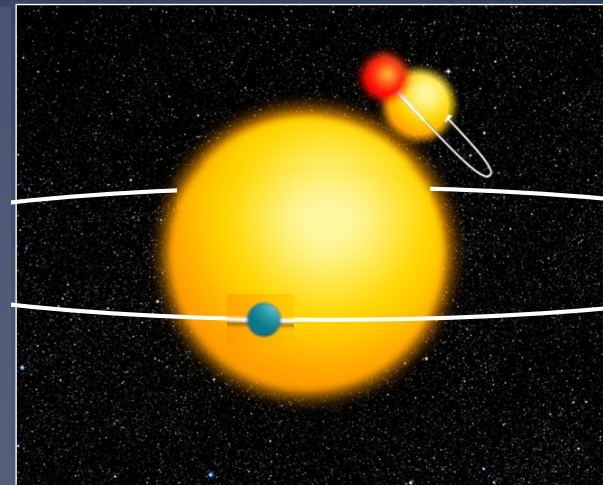
# Double Planets: Two Planets or Planet + EB?

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Two Transiting Planets



1 Planet + Eclipsing Binary



# False Positives in Multi-Planet Transiting Systems

- Consider a target star with:  
Transiting planet and a nearby Eclipsing binary.

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But there are 170 multi-planet systems!  
Nearly all Multi-Planet Systems are pure planets.

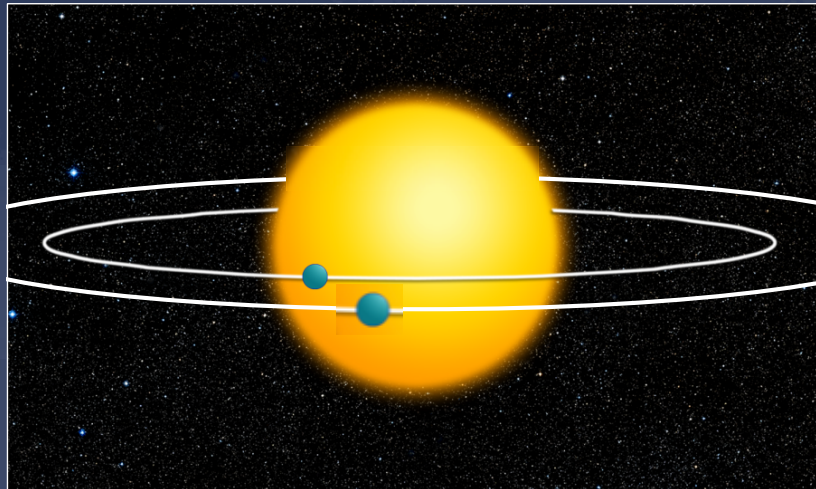




# Double Planets: Two Planets

Double Transit signal could be due to:

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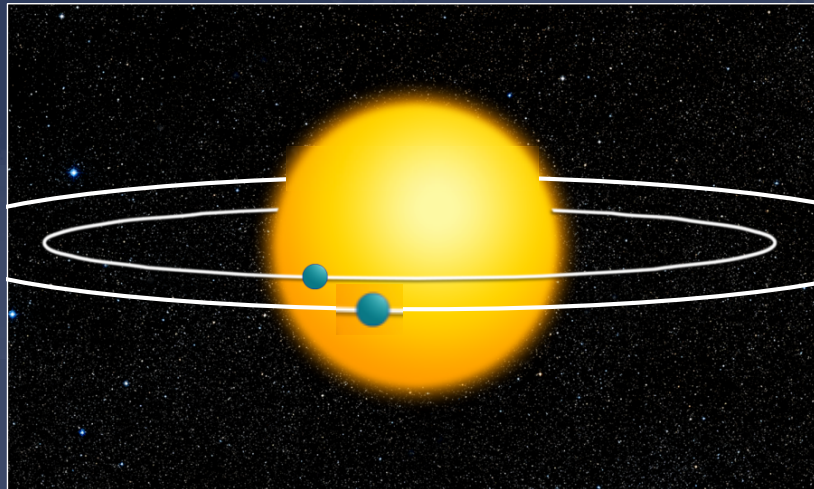


# Double Planets: Two Planets or Two stars

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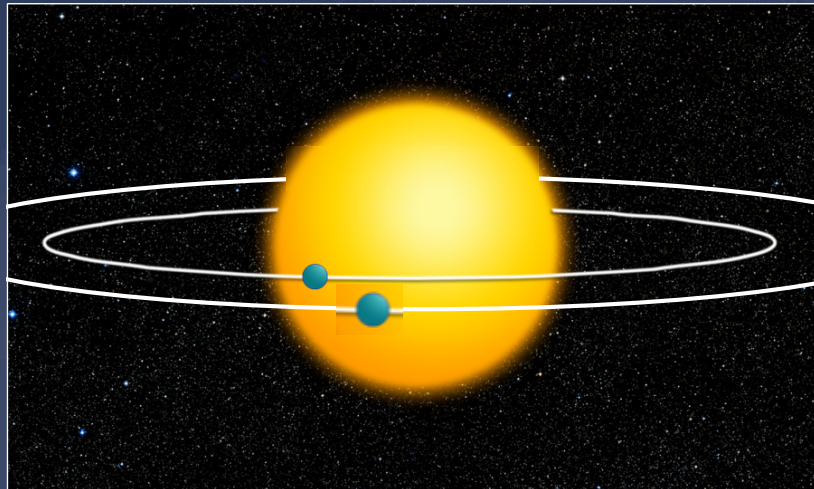
2 Stars: 1 Planet each



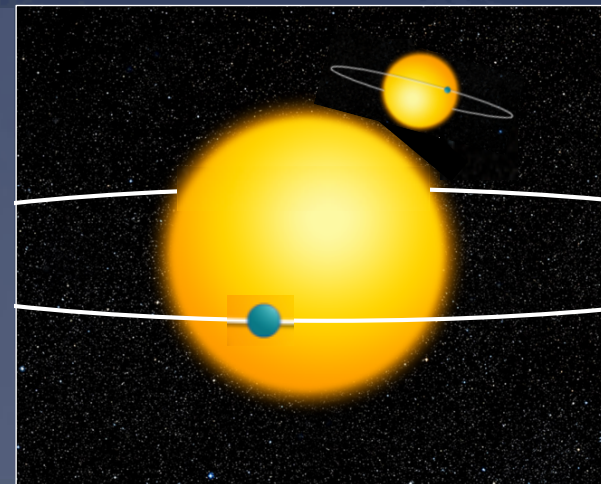
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2 Stars: 1 Planet each



# “False Positives” in Multi-Planet Transiting Systems

- Consider a target star that is a BINARY STAR  
**One Transiting planet around each star.**
- *It masquerades as a double planet.*
- *How common are these?*

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- Predict:  $5 \times 10^{-5} \times 160000 = 8$  Binaries with one planet around each.

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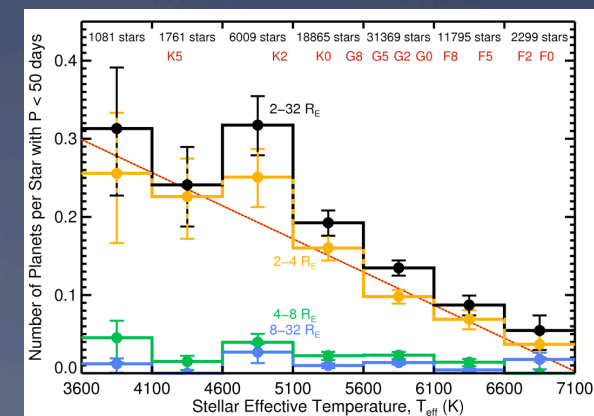
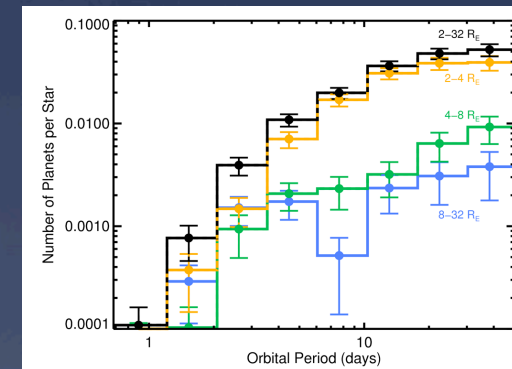
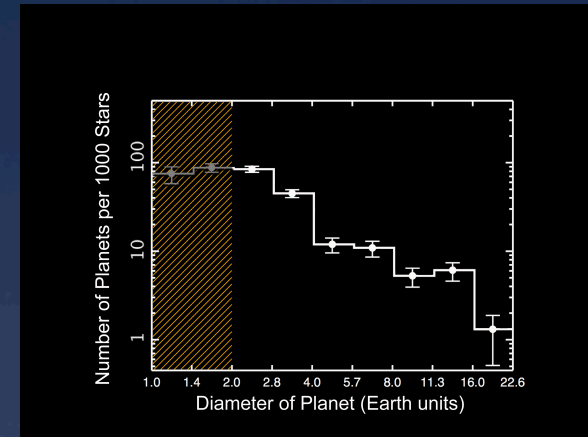
Most apparent Multi-Planets are Planetary Systems

## Summary

- Planet Occurrence increases toward smaller radii, to  $1.5 R_{\text{Earth}}$
- Planet Occurrence increases toward larger orbits
- Planet Occurrence increases toward smaller stars
- 170 Apparent multi-planet systems consist of real planets in systems around one star.

# Conclusions

- \* Planet Occurrence:
  - \* Increases with smaller size
  - \* Increases with larger orbits
- \* Small planets are more frequent around smaller stars



# Basic Equation:

## Expected # of Multis w/ FP

$$1 \text{ planet or FP} + 1 \text{ FP} : \frac{n_c}{n_t} \times \frac{n_c(1-P)}{n_t} \times n_t = (1-P) \frac{n_c^2}{n_t} = 9.5(1-P)$$

$n_c$  is # candidates

$n_t$  is # targets

$P$  is fraction of candidates that are true planets

- 160,000 targets
- 1700 KOIs (1% of the targets)
- 170 false positives (10% estimate for FPs)
- FPs are distributed randomly

Equation (1) predicts only 1 multi-transiting system with a FP

But we observe 170 multis (with 408 planet candidates)!

Nearly all 170 multi-transiting planet systems  
Contain real planets.

# KOI-500

planet	P (days)	Mp(Mearth)
500.05	0.9867790	1.5
500.03	3.0721660	2.2
500.04	4.6453530	4.4
500.01	7.0534780	8.0
500.02	9.5216960	8.5

