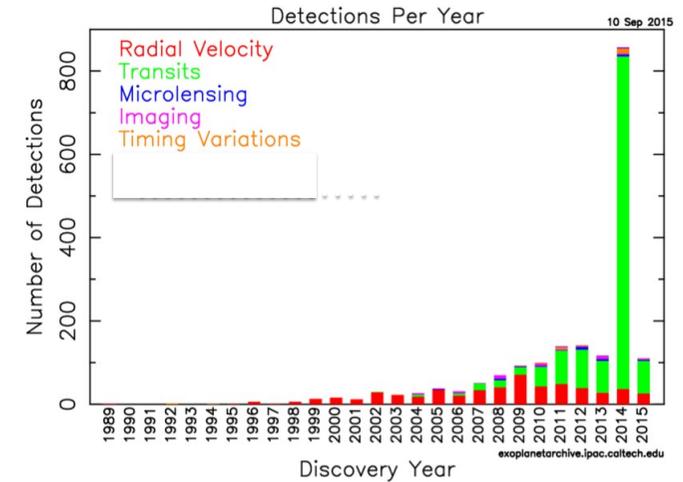


Statistical properties of exoplanets

Planets and Astrobiology (2018-2019)
G. Vladilo

1

Exoplanetary population



3

Main results of exoplanets studies

Statistical properties

Most statistics based on the results obtained with the
Doppler and Transit methods

Updated results can be found at:
exoplanets.org e exoplanet.eu

Understanding observational biases is fundamental to interpret the
observed statistical properties

2

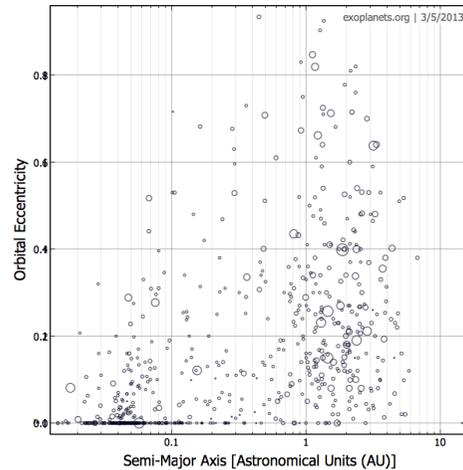
Exoplanet statistical properties

- General properties investigated with statistical methods
 - Orbital properties
 - Orbital periods, semimajor axis, eccentricity, orbital inclinations
 - Planetary properties
 - Masses and radii
 - with the Doppler and transit methods, respectively
 - Occurrence rates
 - Distances
 - Properties of the host stars
 - Metallicities, chemical abundance patterns
- Main results
 - Great variety of orbital parameters and planetary masses/radii
 - Such a variety is not found in the Solar System

4

The variety of orbital properties

- Eccentricity e versus semimajor axis a ; the symbol sizes are proportional to the minimum mass ($M \sin i$)
- The plot shows the great dispersion of the orbital parameters (a, e) and planetary masses
- In the Solar System, the eccentricities are usually small and other regions of the parameter space are not covered



5

The variety of exoplanetary masses

“Jupiters”

$$M \sim 1 M_J$$

“Saturns”

$$M \sim 0.3 M_J$$

“Neptuns”

$$M \sim 0.05 M_J$$

“Super-Earths”

$$M \sim 0.015 M_J$$

$$M_p \sim 10 M_{\text{Earth}}$$

Super-Earths do not exist in the Solar System

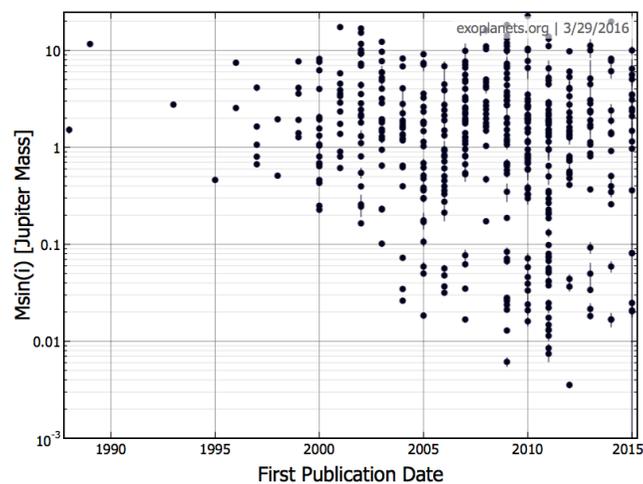
Terrestrial

$$M \sim 0.003 M_J$$

7

Exoplanetary masses

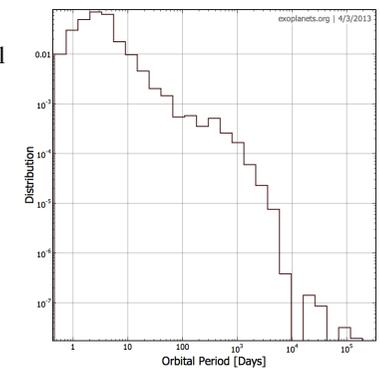
The detection limit of the Doppler method improves over the years



6

Distribution of orbital periods

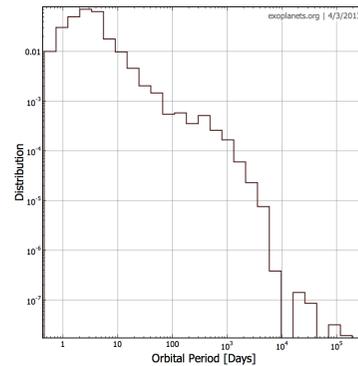
- The distribution peaks at short orbital periods
 - The general trend is the result of several types of selection effects
 - The limited temporal baseline of the observations tends to favour short orbital periods
 - For a given planetary mass, a planet closer to the star (i.e. with shorter period) generates a stronger reflex motion of the host star
 - A planet closer to the star has a higher geometric probability of detection with the transit method



8

Distribution of orbital periods

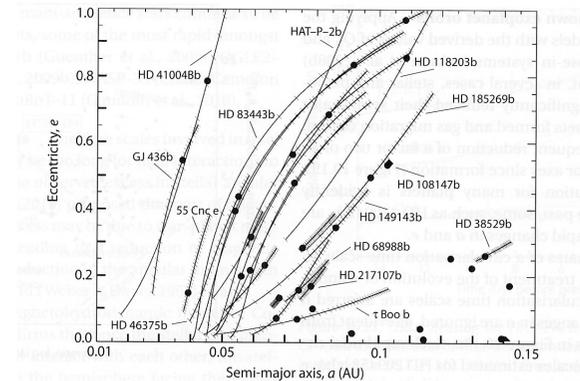
- Evidence for the existence of a peak at $P \approx 3$ days
 - The decrease of frequency at shorter periods cannot be attributed to selection effects
 - The existence of such peak was unexpected from a theoretical point of view
 - Provides important constraints on models of planetary formation and evolution
 - In particular, suggests the existence of a mechanism that breaks the migration of planets towards the central star



9

- The large fraction of planets in low-eccentricity orbits is interpreted as the result of orbital evolution in presence of tidal interactions with the host star
 - Dynamical models indicate that the eccentricity tends to decrease in the course of planetary system evolution

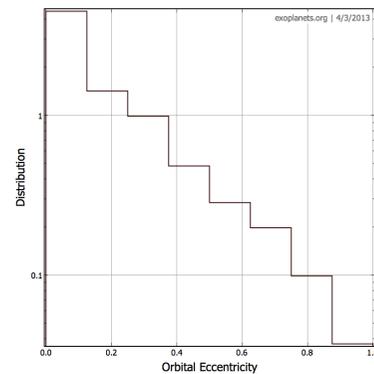
Jackson et al. (2008)



11

Distribution of eccentricities

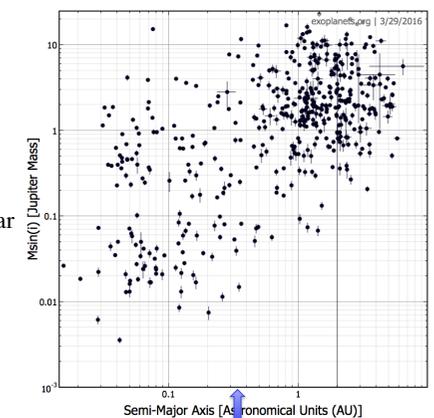
- The distribution shows the existence of planets in highly eccentric orbits
 - virtually the whole possible interval of eccentricities, between 0 and 1, is covered
 - the vast majority of eccentricities is higher than in Solar System planets
- Low eccentricity orbits are more frequent
 - However, the shape of the distribution is affected by observational selection effects and can vary according to the type of observational method adopted to collect the sample



10

Planetary mass versus semimajor axis

- Results from the Doppler method
 - Most detected planets lie within a few AU from the central star
- Discovered “hot-Jupiters”, i.e. giant planets within ≤ 1 AU from the stars
 - Unexpected result from our previous understanding of the Solar System architecture

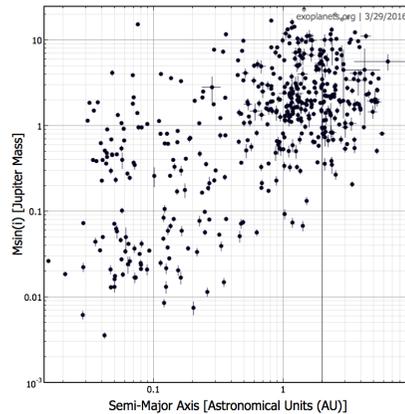


Mercury's semimajor axis

12

Planetary mass versus semimajor axis

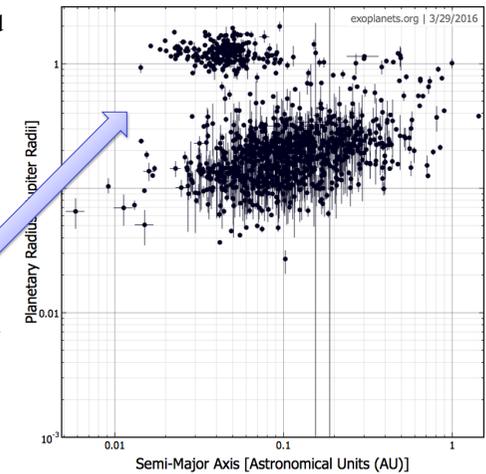
- At large distances from the star, the detected planets are quite massive
- Selection effect: at large semimajor axis, only massive planets have the capability to generate a significant reflex motion of the star
- Physical effect: most massive planets form at larger distances from the central star, where the longer orbits provide more material for the planet to form by accretion



13

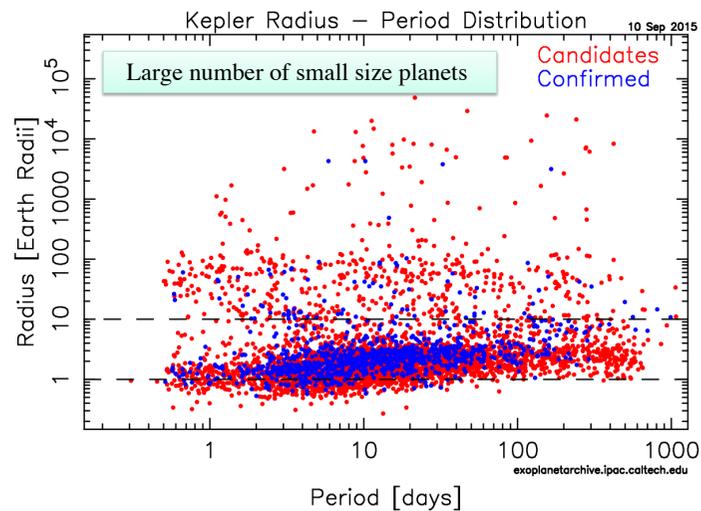
Exoplanets radii versus semimajor axis

- Sample of exoplanets obtained with the transit method, not corrected for selection bias
- The results are biased because the geometric probability scales as R_p/a and the transit depth scales as $(R_p/R_*)^2$
- However, the “sub-jovian” desert seems to be real
- Its interpretation is complex and requires invoking planetary migration and disruption (Matsakos & Koenig 2016)



15

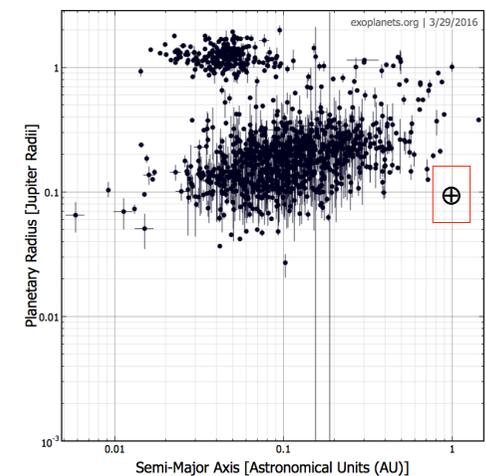
Radii versus period: Kepler data



14

Exoplanets radii versus semimajor axis

- A large number of terrestrial-size planets are found, despite the difficulty of detecting small planets
- Terrestrial-size planets are still difficult to detect at large values of semimajor axis



16

Occurrence rates

- A general result provided by exoplanet surveys is that planetary systems are quite common around stars
- The high occurrence rate favours scenarios in which the process of planetary formation is closely related to the process of stellar formation
- A low occurrence rate would have left room for alternative scenarios, with planets arising from events that are distinct from star formation
 - An example was the tidal theory, where planets condense from material stripped from a star during an encounter with another star
 - Stellar encounters extremely unlikely and would yield a very small fraction of planetary systems, contrary to what we now observe

17

Occurrence rates around FGK stars

$$\frac{dN}{d \ln P d \ln M}$$

Table 1 Planet occurrence rates around FGK stars

Study	Technique	Period range	Size range	Occurrence [%]
Wright et al. (2012)	Doppler	<10 days	>30 M_{\oplus}	1.20 ± 0.38
Mayor et al. (2011)	Doppler	<11 days	>50 M_{\oplus}	0.89 ± 0.36
Cumming et al. (2008)	Doppler	<5.2 years <100 days	>100 M_{\oplus} >100 M_{\oplus}	8.5 ± 1.3 2.4 ± 0.7
Howard et al. (2010)	Doppler	<50 days <50 days	3–10 M_{\oplus} 10–30 M_{\oplus}	11.8 ^{+4.3} _{-3.5} 6.5 ^{+3.0} _{-2.3}
Mayor et al. (2011)	Doppler	<50 days <50 days <10 years	3–10 M_{\oplus} 10–30 M_{\oplus} >50 M_{\oplus}	16.6 ± 4.4 11.1 ± 2.4 13.9 ± 1.7
Pressin et al. (2013)	Transit	<10 days <85 days <85 days <85 days <85 days	6–22 R_{\oplus} 0.8–1.25 R_{\oplus} 1.25–2 R_{\oplus} 2–4 R_{\oplus} 1.25–22 R_{\oplus}	0.43 ± 0.05 16.6 ± 3.6 20.3 ± 2.0 19.9 ± 1.2 52.3 ± 4.2
Petigura et al. (2013)	Transit	5–100 days 5–100 days	1–2 R_{\oplus} 8–16 R_{\oplus}	26 ± 3 1.6 ± 0.4

$$\frac{dN}{d \ln P d \ln R_p}$$

19

Occurrence rates

- The study of occurrence rates corrected for observational selection effects provides powerful constraints to models of planetary formation
- The occurrence rate is the mean number of planets per star having properties within a specified range
 - In practice, the planet properties are chosen among those measurable with a given observational technique
 - For instance, for a survey performed with the Doppler method one can define the occurrence rate as the mean number of planets per star having masses and orbital periods within a specified range

$$\frac{dN}{d \ln P d \ln M}$$

- To minimize selection effects, one limits the range of planetary quantities according to the observational limits
- As an example, $M_p > 10 M_{\oplus}$ and $P < 1$ yr

18

Trends of occurrence rates

- Within the specified observational limits, occurrence rates can be modelled with analytical functions
 - For instance, the occurrence rate derived from Doppler surveys of FGK stars, $M_p > 100 M_{\oplus}$ and $P < 5.5$ yr can be modelled as

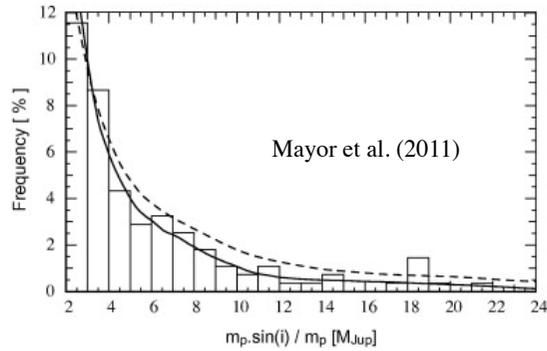
$$\frac{dN}{d \ln P d \ln M_p} \propto M_p^{\alpha} P^{\beta}$$

- with $\alpha = -0.31 \pm 0.20$ and $\beta = 0.26 \pm 0.10$ (Cumming et al. 2008)
- This result suggests that the planet frequency increases with decreasing mass and increasing orbital period
- The results cannot be extrapolated outside the observational limits

20

Distribution of planetary masses

- $M \sin i$ distribution obtained with the Doppler method
- The distribution increases towards values of low mass
 - Despite the selection effect that favours the detection of high mass planets
 - Whether this trend extends to the terrestrial mass regime needs to be confirmed with a larger sample of Earth-mass planets



21

Occurrence rates of Earth-like planets

- The occurrence rate of Earth-like planets is usually calculated taking into account the planet mass (or size) and the insolation (rather than the orbital period or semimajor axis)
 - The insolation is a key parameter that governs the planet surface temperature and habitability

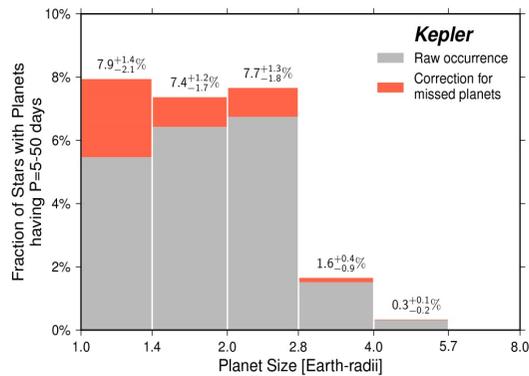
$$S = \frac{L_{\star}}{4\pi a^2}$$

- The motivation for calculating the occurrence rate of Earth-size planets according to their level of insolation is astrobiological
- The choice of the interval of insulations is related to the definition of circumstellar habitable zone (discussed in a subsequent lesson)

23

Distribution of planetary radii

- Once corrected for selection effects, also the distribution of radii indicates that small-size planets are more frequent than large planets



22

Occurrence rates of Earth-like planets

Table 2 Occurrence rates of Earth-like planets

Type of star	Type of planet	Approximate HZ boundaries ^a [S/S_{\oplus}] ^b	Occurrence rate [%]	Reference
M	1–10 M_{\oplus}	0.75–2.0	41^{+54}_{-13}	Bonfils et al. (2013)
FGK	0.8–2.0 R_{\oplus}	0.3–1.8	$2.8^{+1.9}_{-0.9}$	Catanzarite & Shao (2011)
FGK	0.5–2.0 R_{\oplus}	0.8–1.8	34 ± 14	Traub (2012)
M	0.5–1.4 R_{\oplus}	0.46–1.0	15^{+13}_{-6}	Dressing & Charbonneau (2013)
M	0.5–1.4 R_{\oplus}	0.22–0.80	48^{+12}_{-24}	Kopparapu (2013)
GK	1–2 R_{\oplus}	0.25–4.0	11 ± 4	Petigura et al. (2013)
FGK	1–2 R_{\oplus}	0.25–4.0 ^c	$\sim 0.01^c$	Schlaufman (2014)
FGK	1–4 R_{\oplus}	0.35–1.0	$6.4^{+3.4}_{-1.1}$	Silburt et al. (2015)
G	0.6–1.7 R_{\oplus}	0.51–1.95	$1.7^{+1.8}_{-0.9}$	Foreman-Mackey et al. (2014)

^aIn many cases the actual habitable zone (HZ) definitions used by the authors were more complex; please refer to the original papers for details.
^b S refers to the incident flux of starlight on the planet, and S_{\oplus} to the Earth's insolation. All these works are based on *Kepler* data except Bonfils et al. (2013), which is based on the HARPS Doppler survey, and Schlaufman (2014), which is based on both *Kepler* and the Keck Doppler survey.
^cThe result is much lower than the others because the author also required the Earth-sized planet to have a long-period giant-planet companion.

24