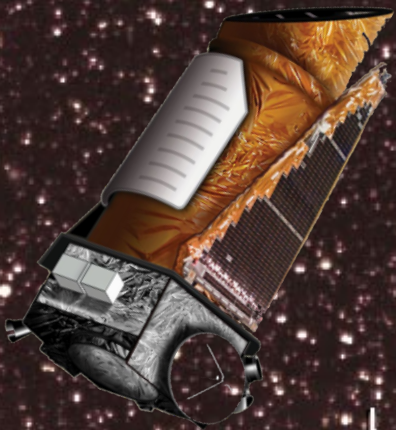


# **Supercomputing in the Age of Discovering Superearths, Earths and Exoplanet Systems**

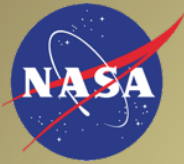
**Jon M. Jenkins  
NASA Ames Research Center**

**Wednesday September 28, 2015**

**Ad Hoc Big Data Task Force  
of the  
NASA Advisory Council Science Committee**



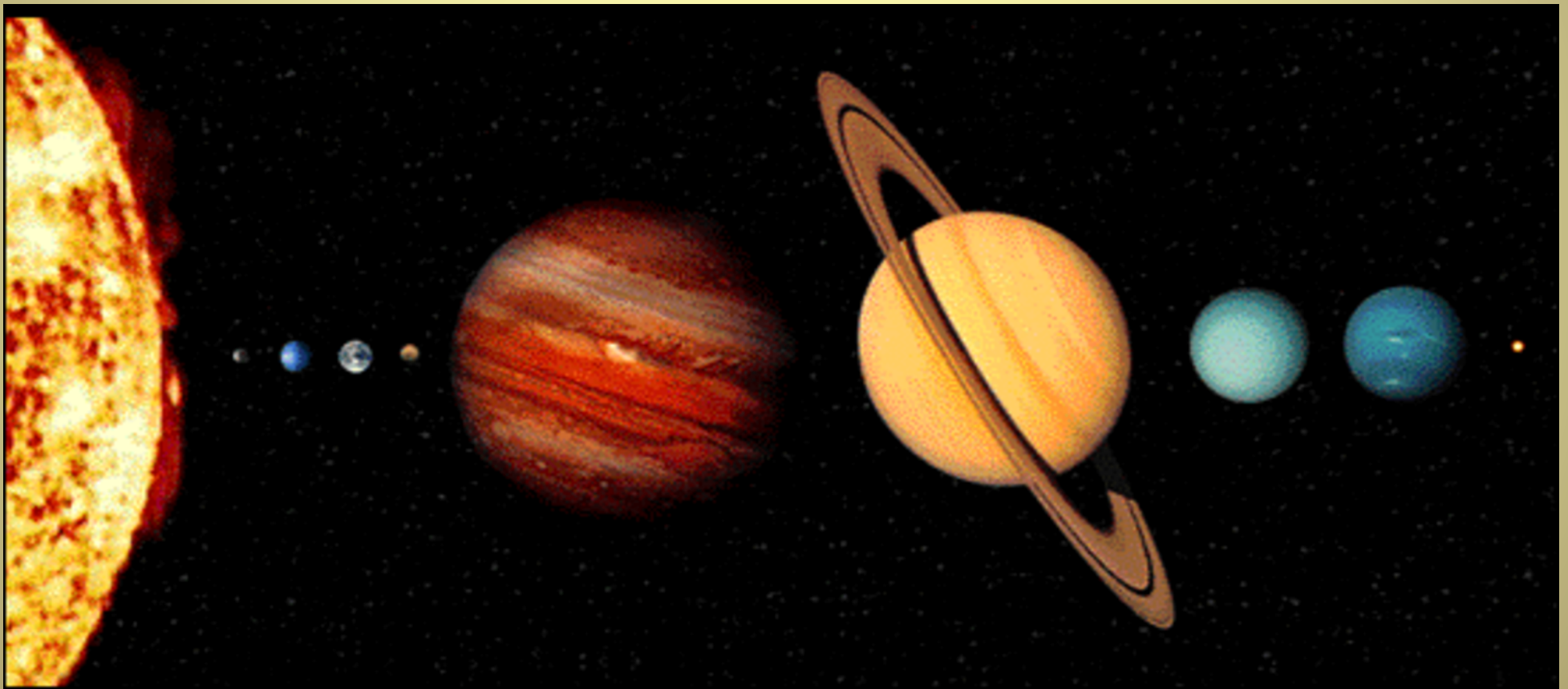


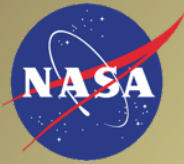


## All the Known Planets In 1994

*Kepler*

*A Search for Earth-size  
Planets*

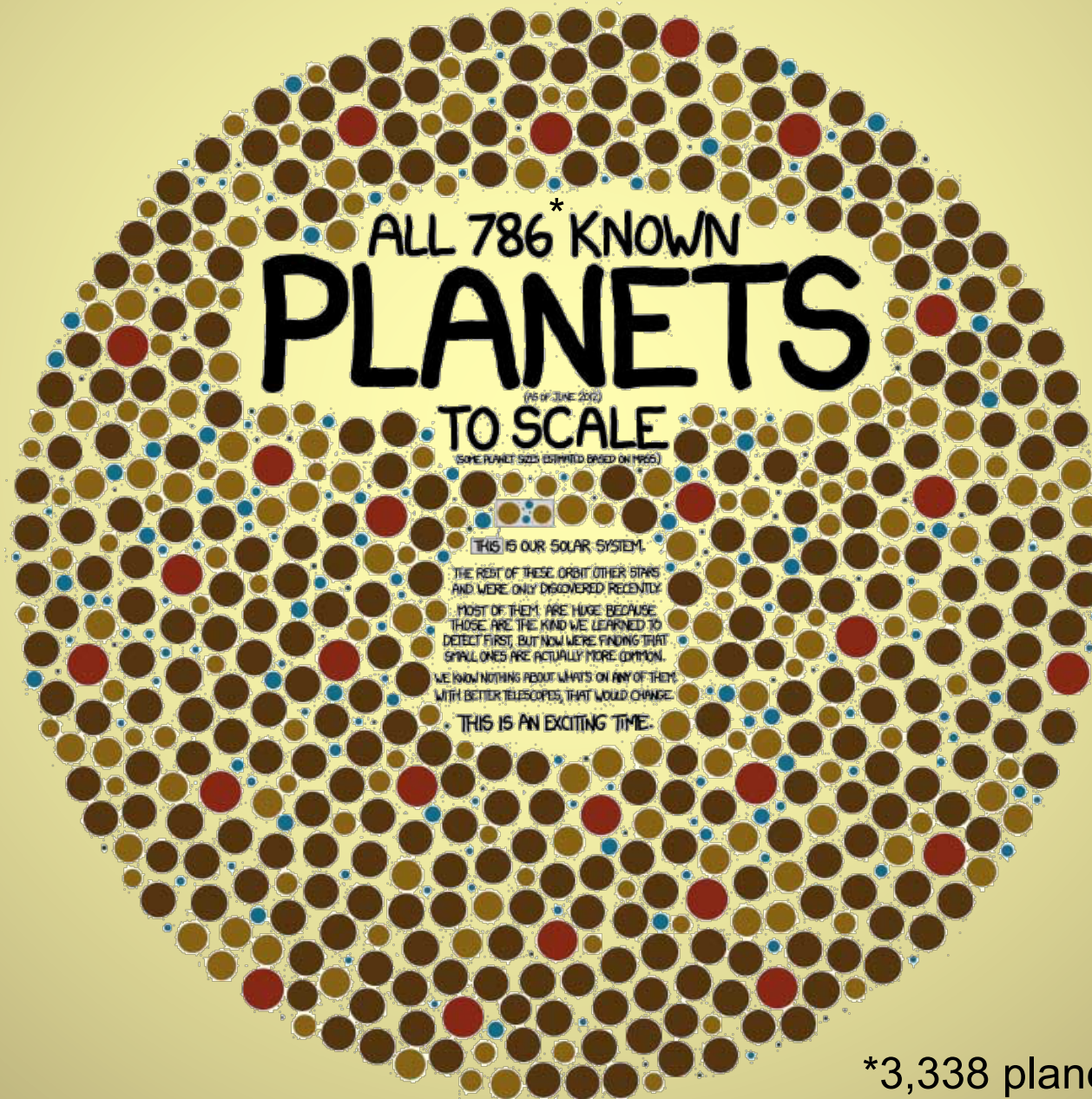




# A More Recent Pictures of Planets

Kepler

A Search for Earth-size Planets



\*3,338 planets as of 9/28/16



ALL 786 KNOWN

*Kepler*  
A Search for Earth-size

# PLANETS

(AS OF JUNE 2012)

## TO SCALE

(SOME PLANET SIZES ESTIMATED BASED ON MASS)



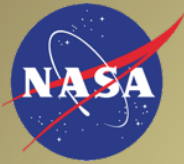
THIS IS OUR SOLAR SYSTEM.

THE REST OF THESE ORBIT OTHER STARS  
AND WERE ONLY DISCOVERED RECENTLY.

MOST OF THEM ARE HUGE BECAUSE  
THOSE ARE THE KIND WE LEARNED TO  
DETECT FIRST, BUT NOW WE'RE FINDING THAT  
SMALL ONES ARE ACTUALLY MORE COMMON.

WE KNOW NOTHING ABOUT WHAT'S ON ANY OF THEM.

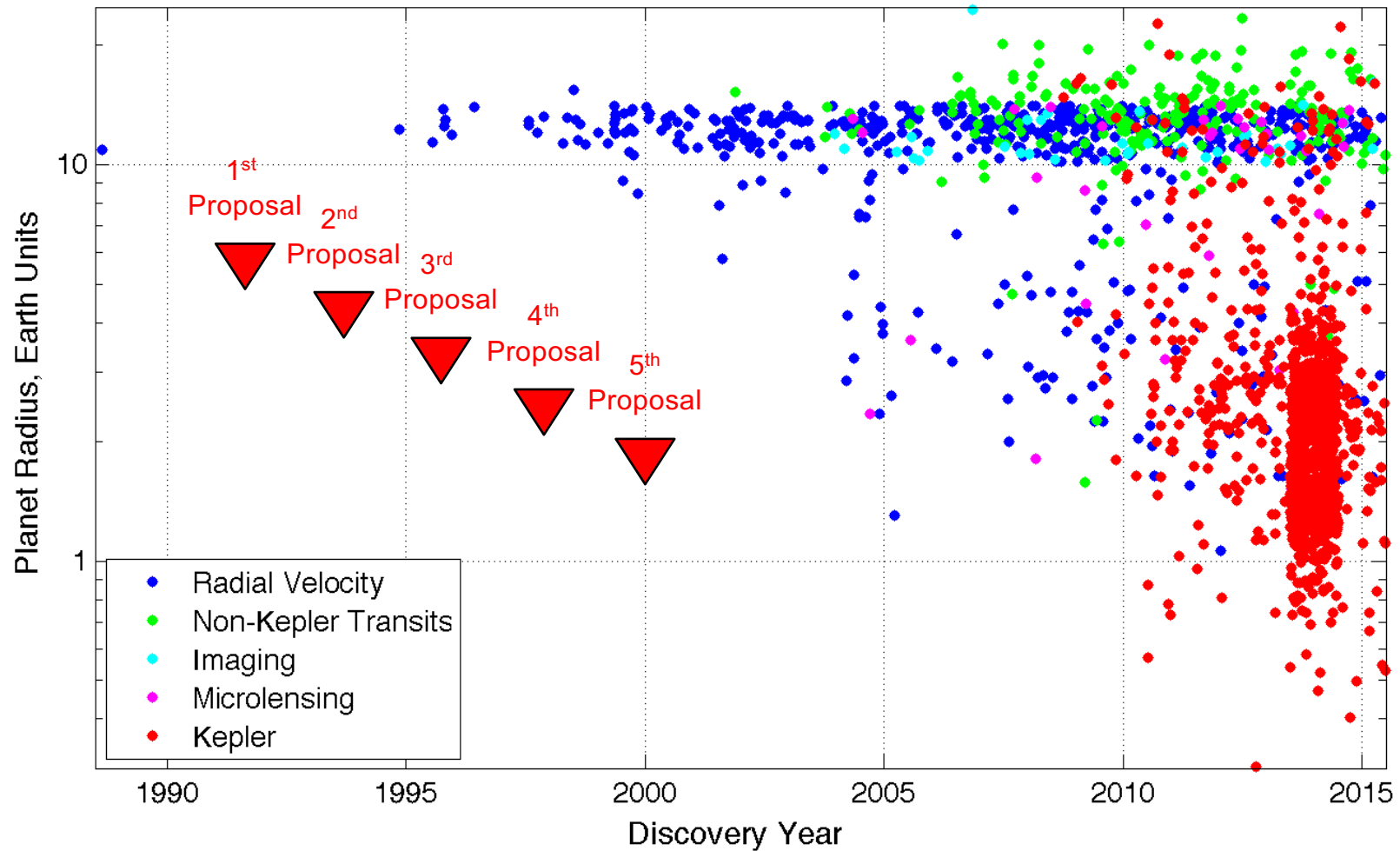




# Exoplanet Discoveries Over Time

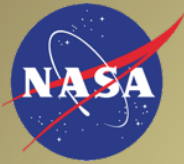
Kepler

A Search for Earth-size Planets



Radii estimated for non-transiting exoplanets  
Discovery data dithered randomly within discovery year



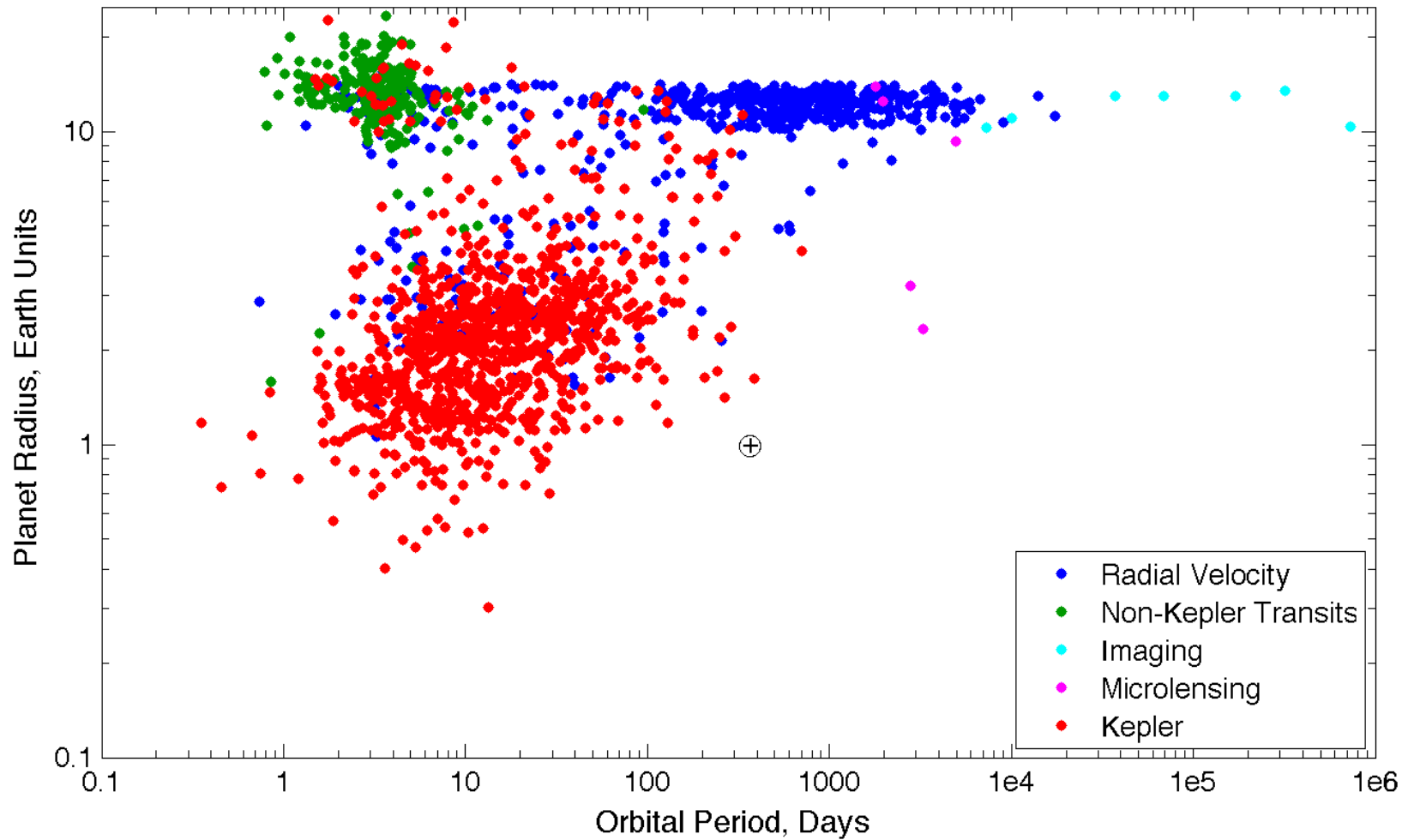


# Exoplanet Discoveries

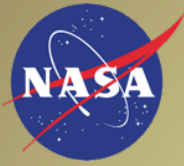
*Kepler*

*A Search for Earth-size Planets*

2015





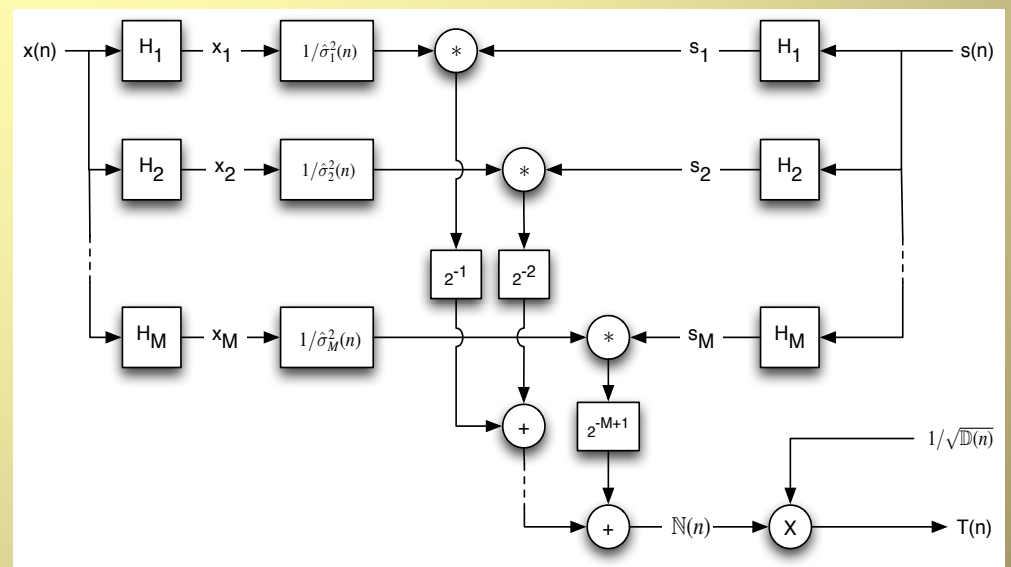


# Enabling Kepler

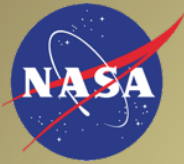
Kepler

A Search for Earth-size Planets

- Back illuminated CCDs (20 ppm photometric precision)
- Sophisticated algorithms
- Computational infrastructure







# How Does Kepler Work?

*Kepler*

*A Search for Earth-size  
Planets*

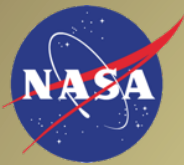


BRIGHTNESS

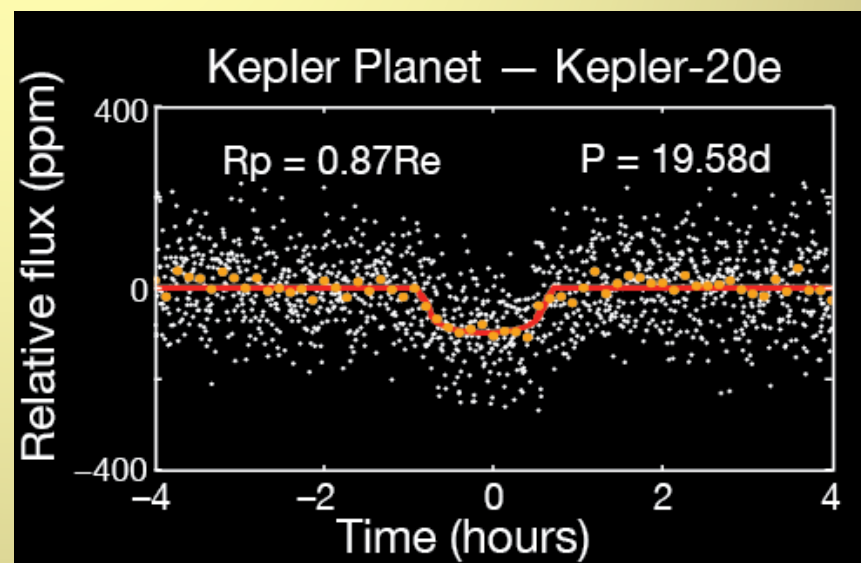
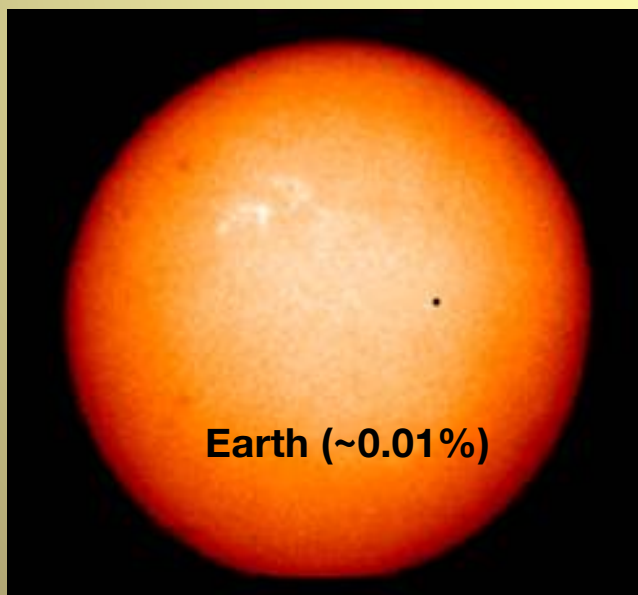
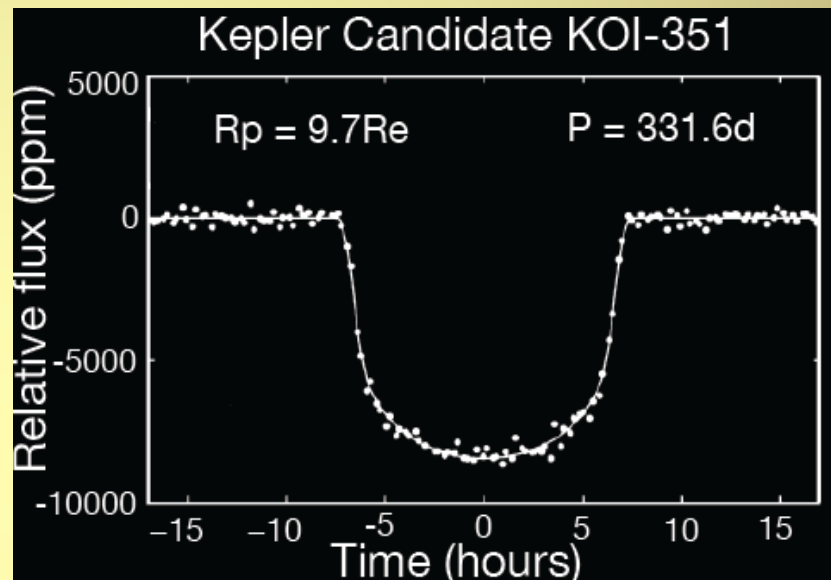
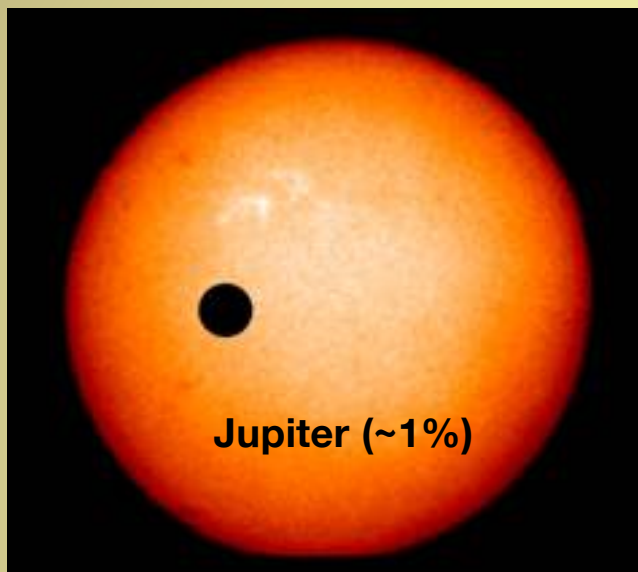


TIME IN HOURS

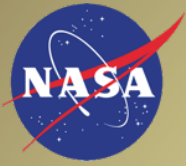




# How Hard is it to Find Good Planets?







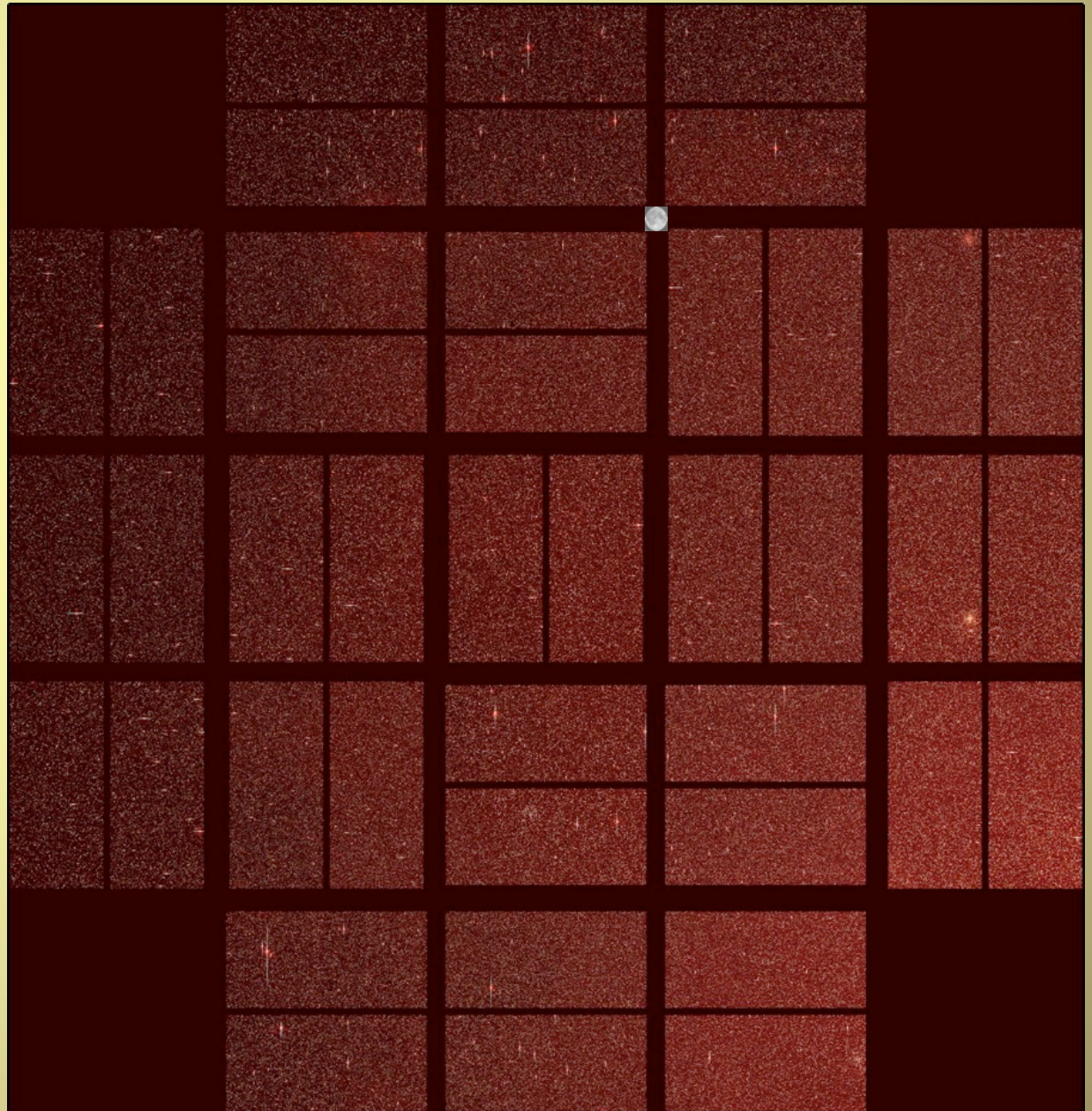
# First Light Image

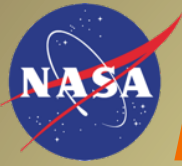
*Kepler*

*A Search for Earth-size  
Planets*



- Launched March 7 2009

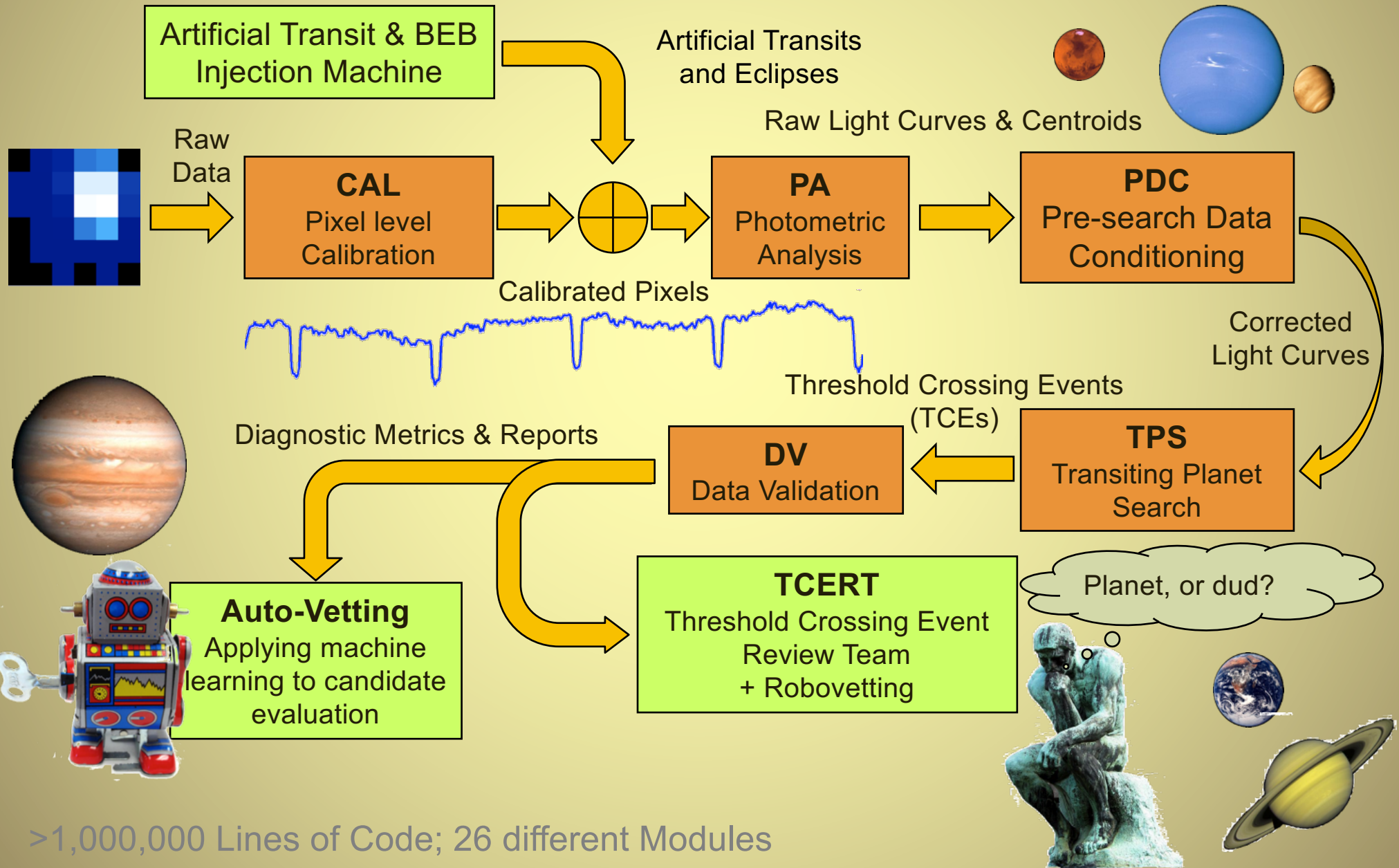




# Kepler's Science Pipeline

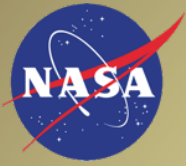
## Kepler

A Search for Earth-size Planets



>1,000,000 Lines of Code; 26 different Modules



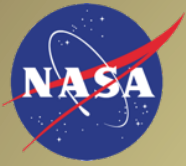


# The Search Problem

*Kepler*

*A Search for Earth-size  
Planets*





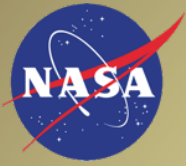
# The Search Problem

*Kepler*

*A Search for Earth-size  
Planets*





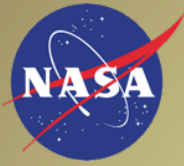


# The Search Problem

*Kepler*  
A Search for Earth-size  
Planets







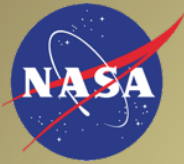
# Keeping Up with the Data

*Kepler*

*A Search for Earth-size  
Planets*







## Hardware Architecture: Kepler Science Operations Center

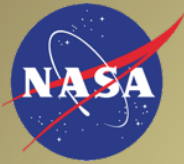
*Kepler*

*A Search for Earth-size  
Planets*



64 hosts, 712 CPUs,  
3.7 TB of RAM,  
~300 TB of raw disk storage





# Hardware Architecture: NAS Pleiades Supercomputer

*Kepler*  
A Search for Earth-size  
Planets

7.25 Pflop/s peak cluster

246,048 cores

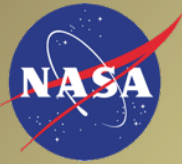
938 TB of memory

29 PB of storage



Transiting Planet Search Running on Pleiades



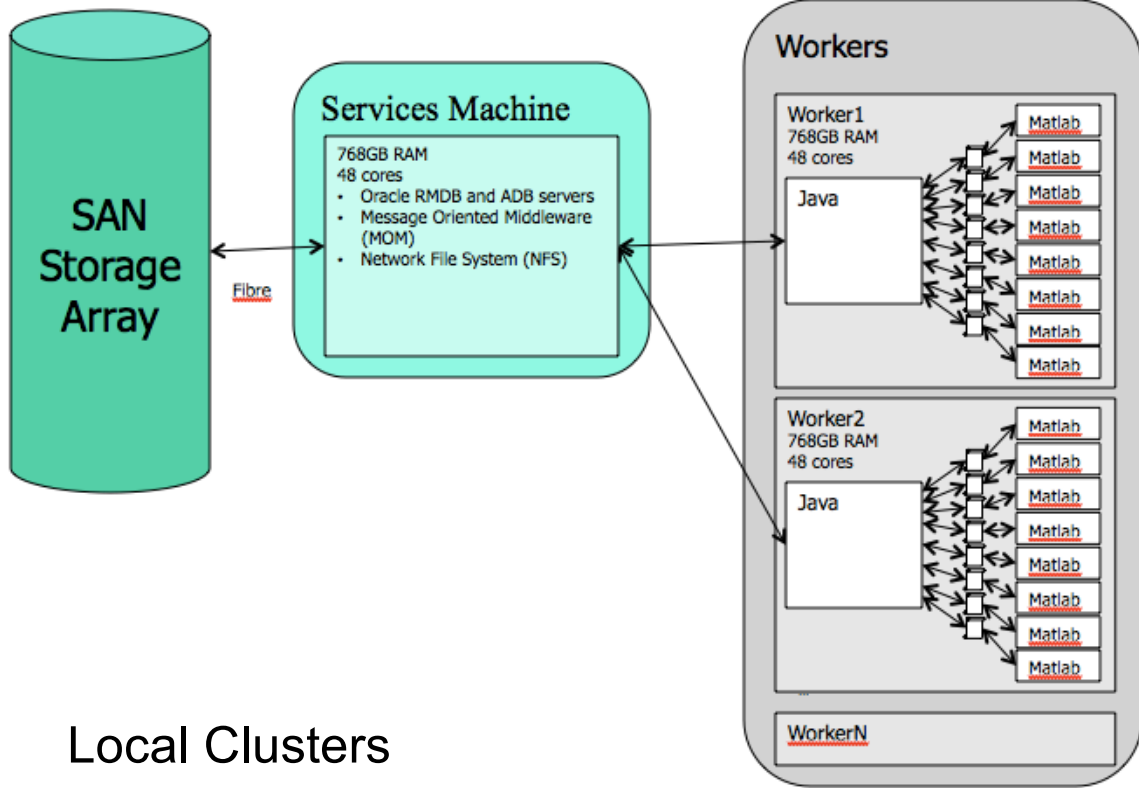
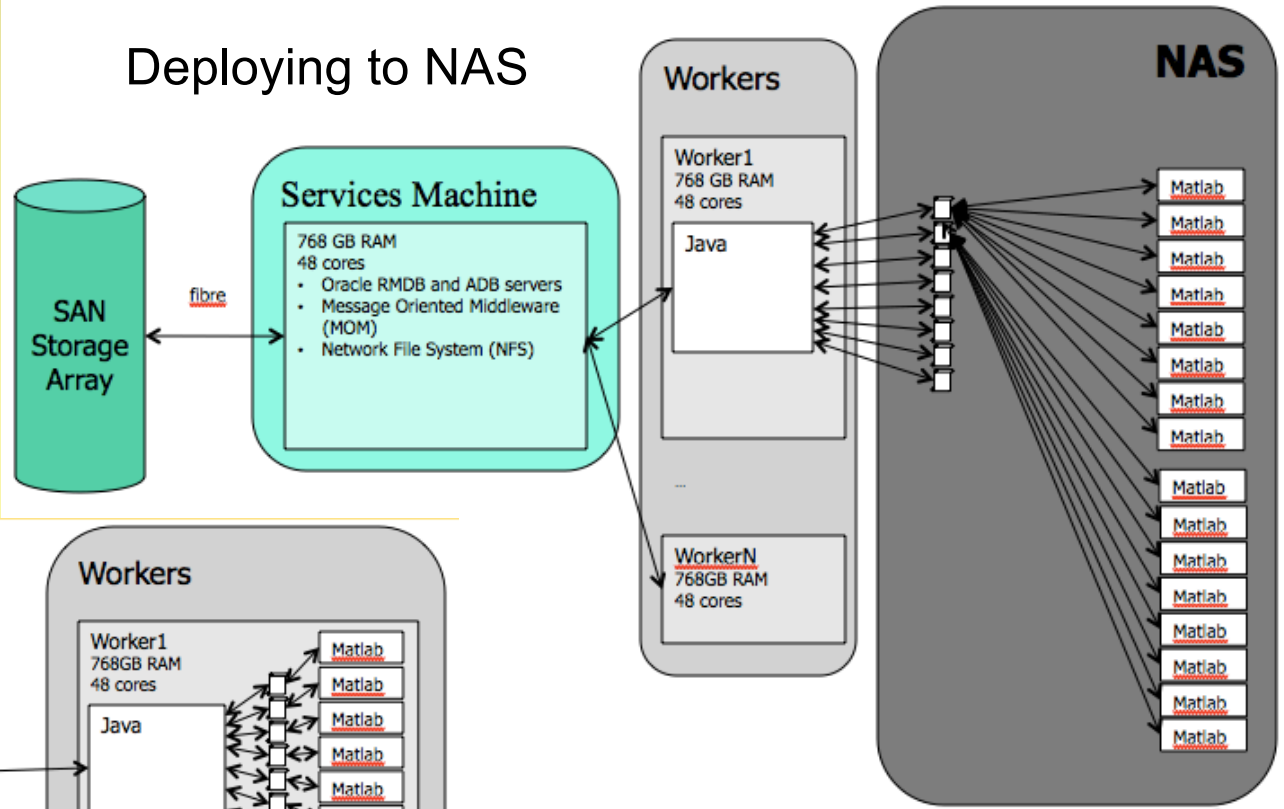


# Processing Kepler Data on the NAS Pleiades



A Search for Earth-size Planets

## Deploying to NAS

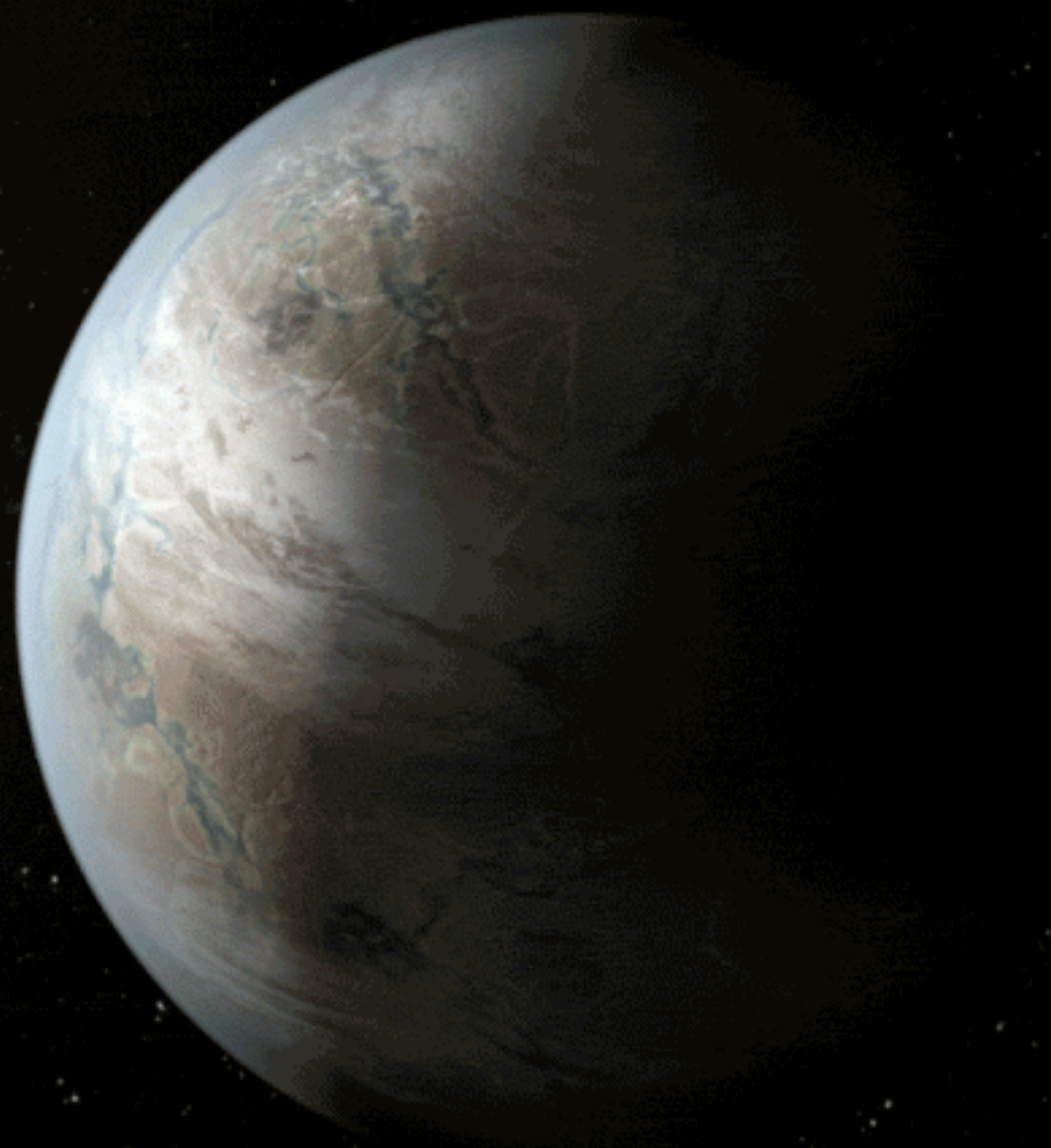


Local Clusters

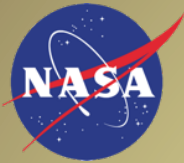
Processing scales from 100s of cores on local cluster to 10s of 1000s of cores on the NAS

Kepler-452b

ARTISTIC CONCEPT



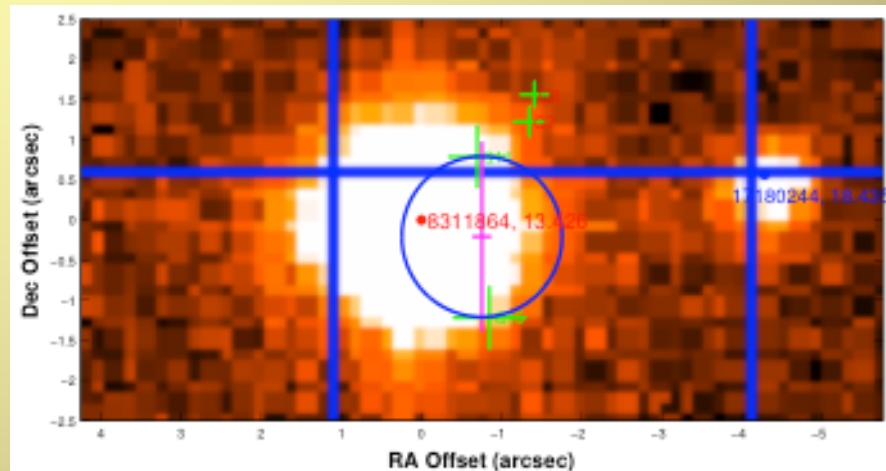
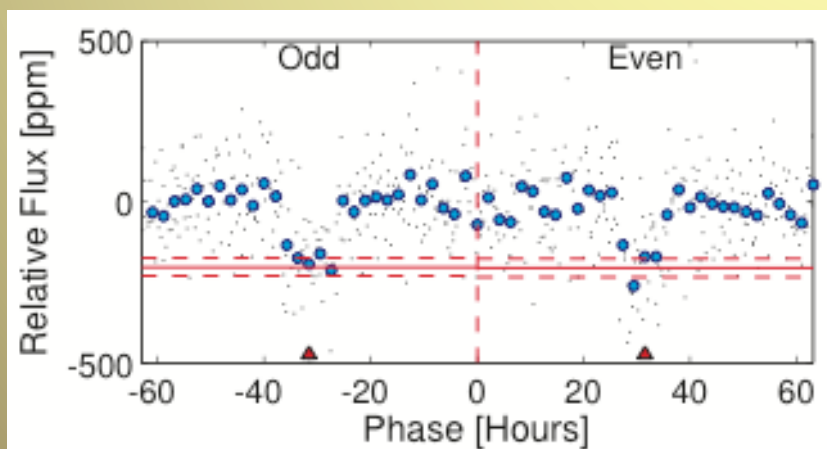
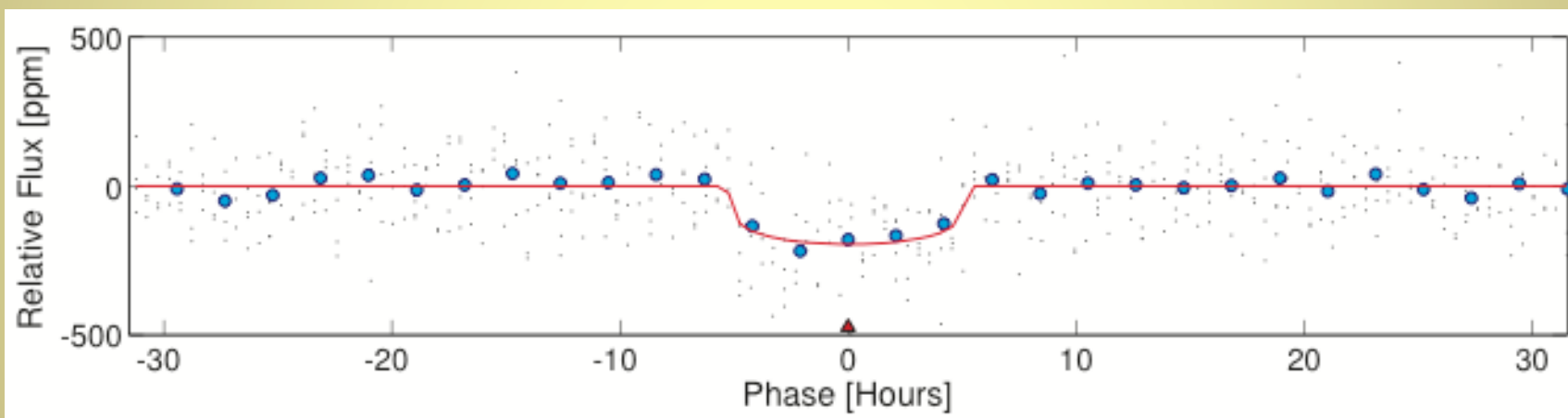
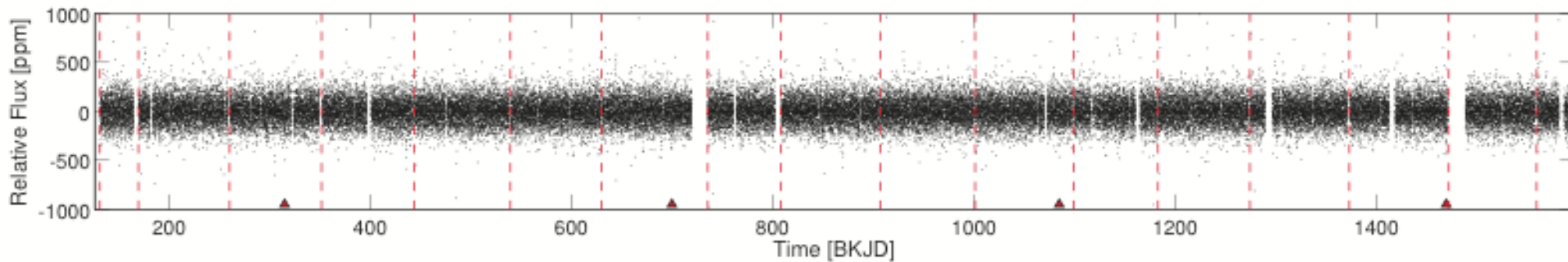


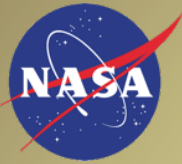


# Light Curve

Kepler

A Search for Earth-size Planets





# Statistical Validation of Planet Candidates

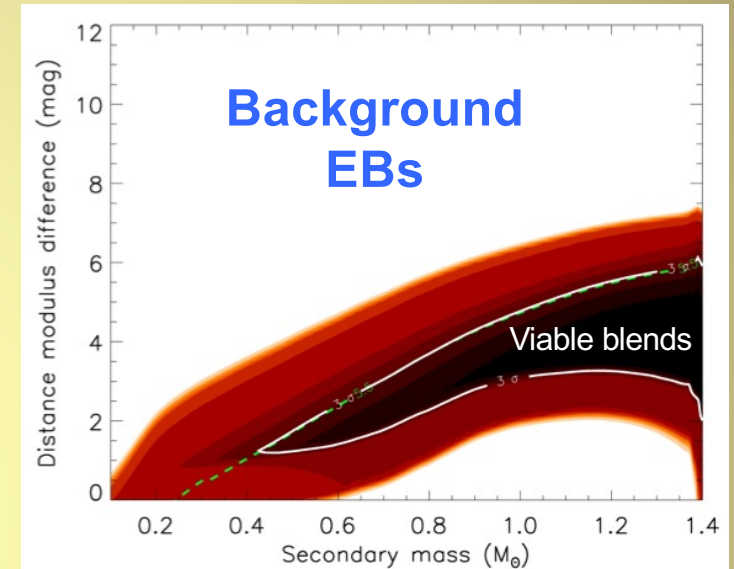
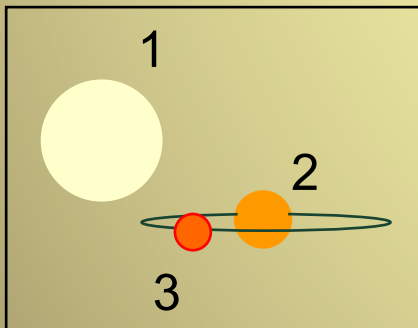
*Kepler*  
A Search for Earth-size Planets

Transit-like signals can be produced by a number of astrophysical phenomena

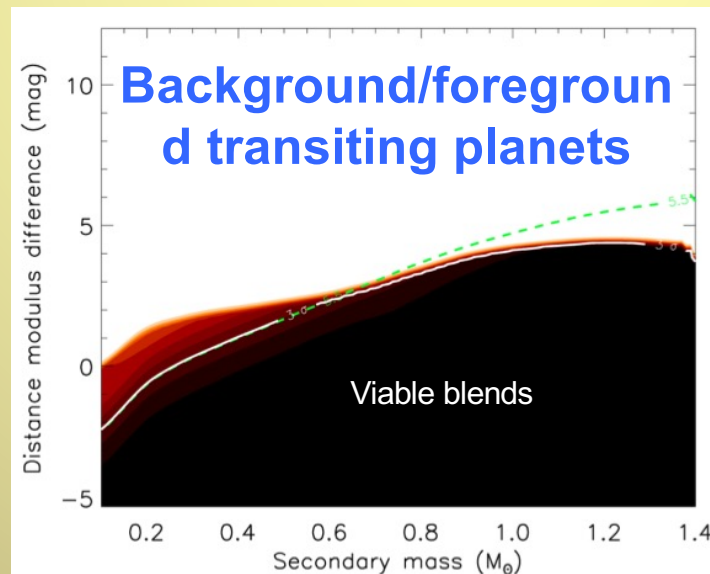
- Background Eclipsing Binaries
- Triple star systems with an EB/planet
- Background/Foreground planet

BLENDER can assess statistical confidence in planetary nature of a candidate

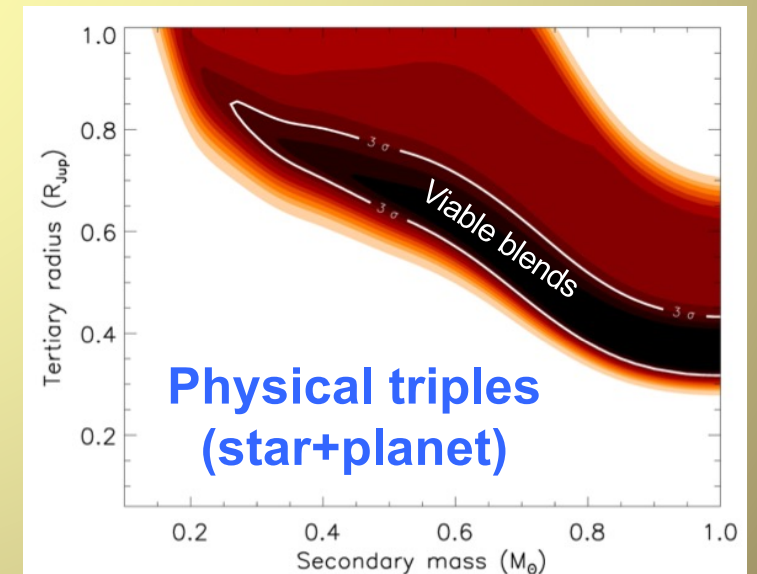
Computationally intensive: Supercomputer essential



W. Torres 2013

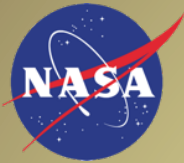


W. Torres 2013



W. Torres 2013





# Blender Analysis for Kepler-452b

Kepler

A Search for Earth-size Planets

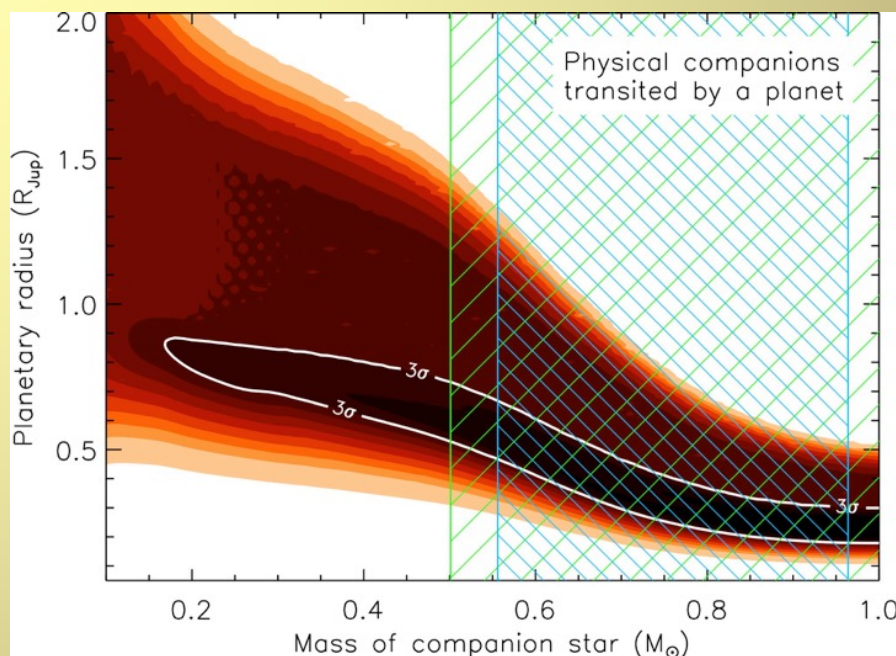
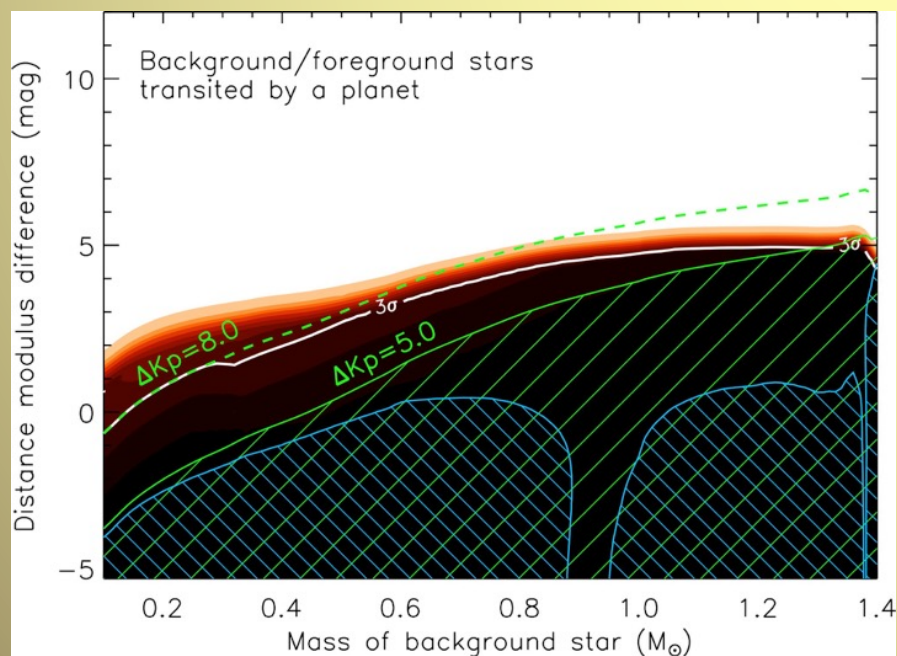
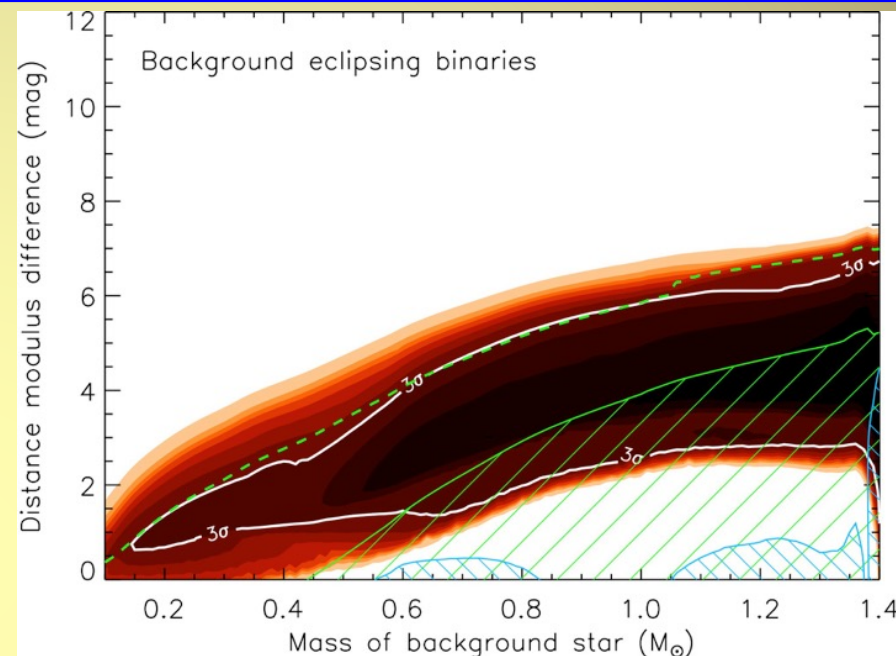
BEB odds:  $1.21 \times 10^{-12}$

BP odds:  $2.56 \times 10^{-10}$

HTP odds:  $2.35 \times 10^{-6}$

Vs: (Expected) Planet odds:  $9.97 \times 10^{-4}$

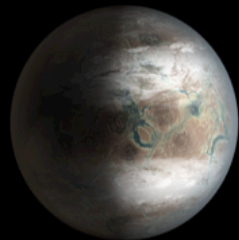
Therefore, odds ratio is  $\sim 424:1$



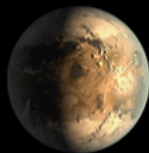
Kepler-452  
System

Kepler-186  
System

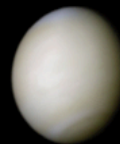
Solar  
System



Kepler-186f



Mercury Venus



Earth



Mars

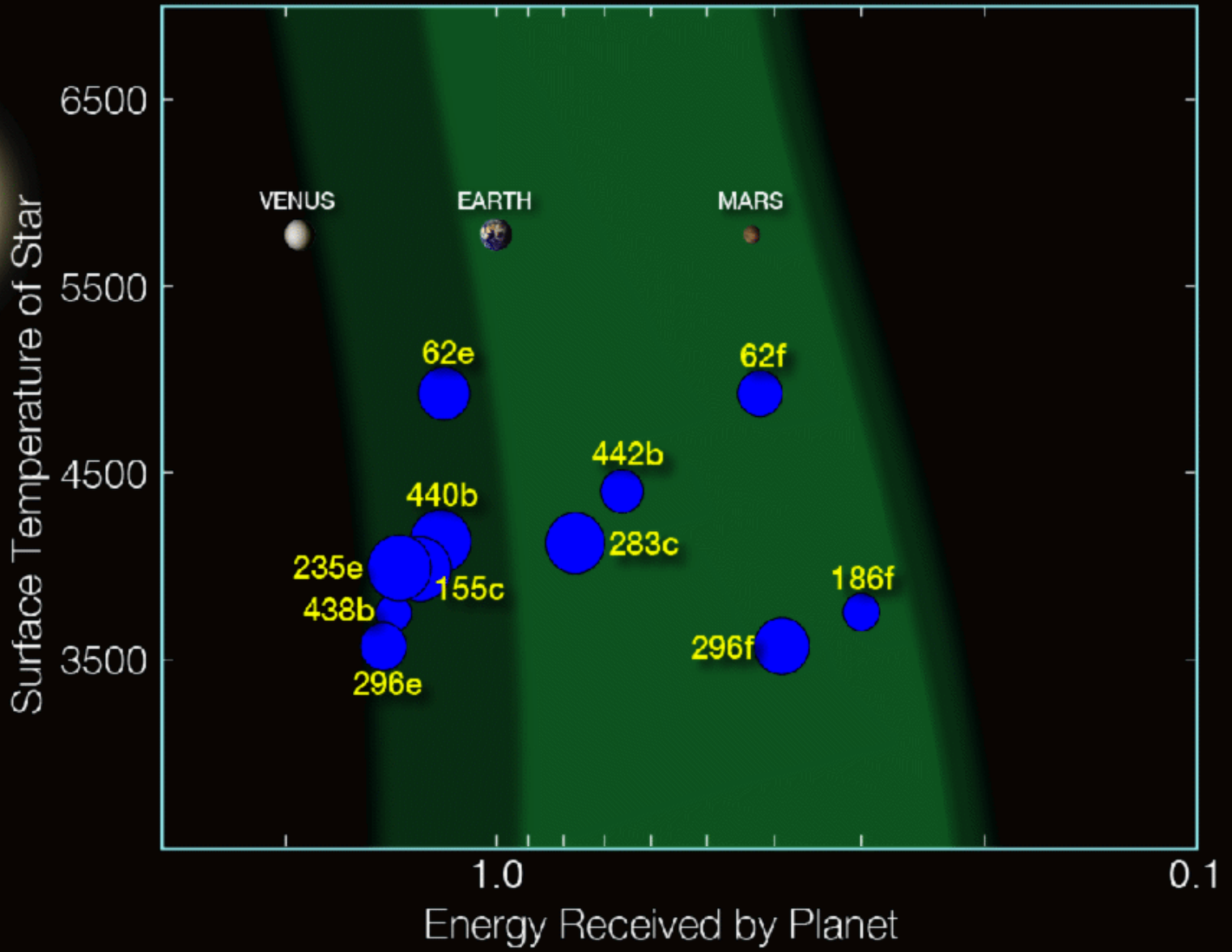
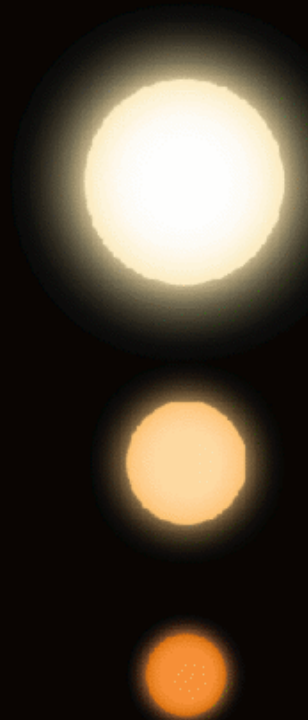


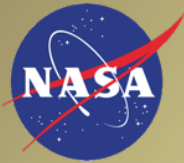
Kepler-452b

ARTISTIC CONCEPT



# Kepler Small Habitable Zone Planets Now Include One Orbiting a Sun-Like Star





# Searching for Exomoons

*Kepler*

*A Search for Earth-size  
Planets*

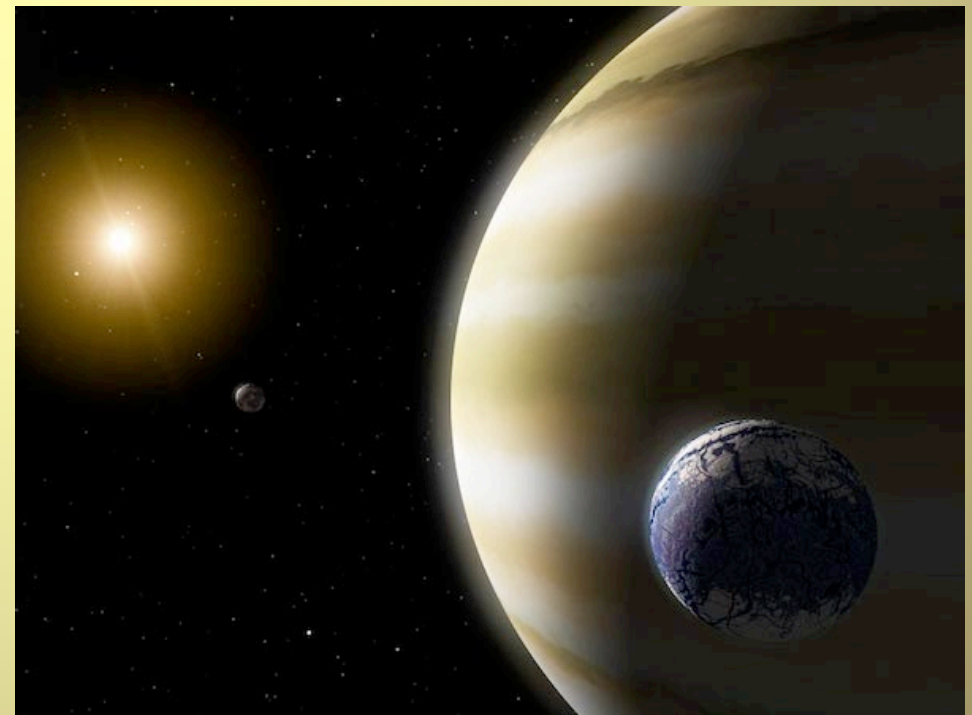
David Kipping and team  
have been searching for  
exomoons in ~400 light  
curves from Kepler on the  
NAS Pleiades  
supercomputer

Each search consumes  
50,000 CPU hours

~40 light curves were  
searched as of 2014

~300 were search in 2015

Exomoons remain elusive:  
None have been  
conclusively discovered

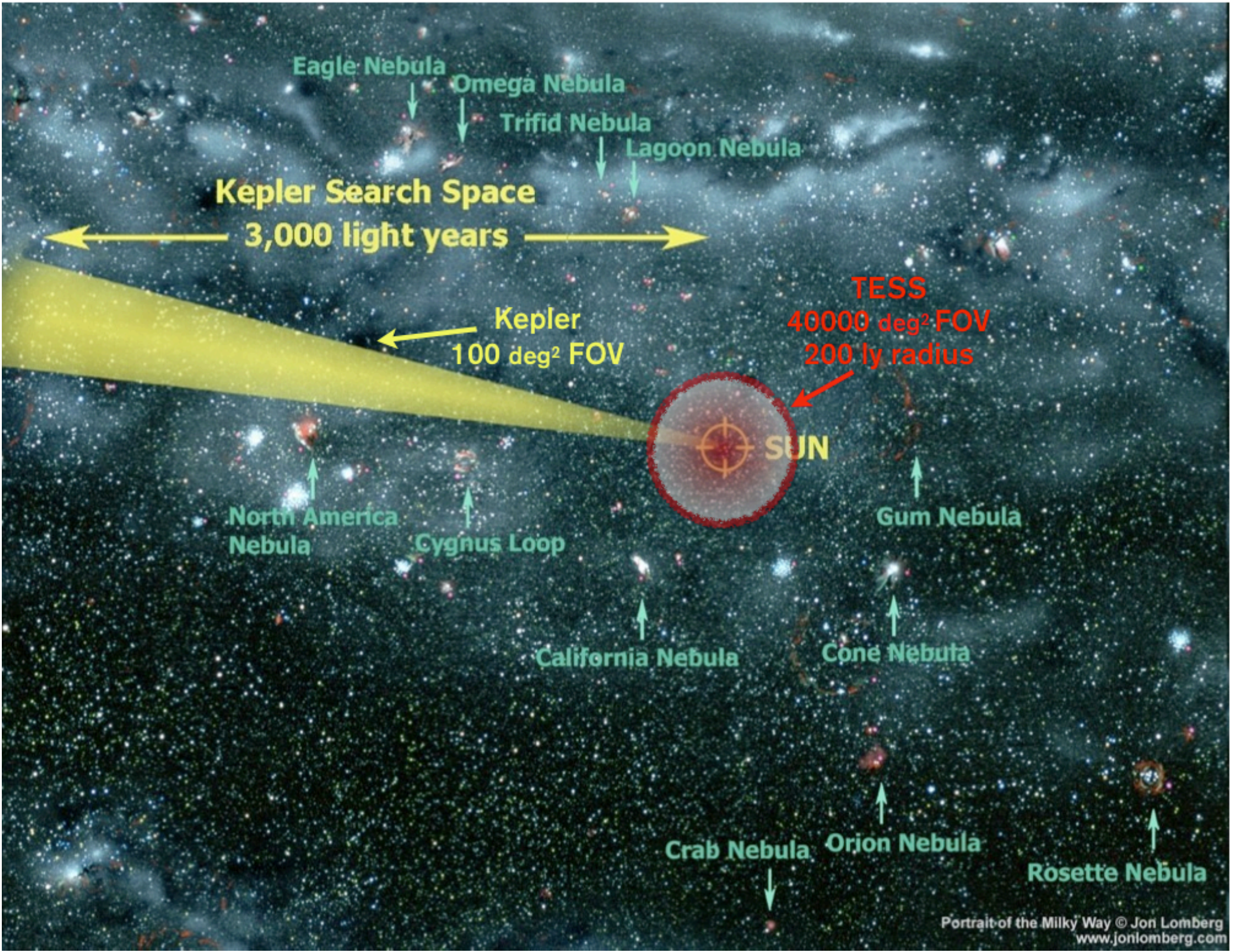






**TESS Elation!**





Eagle Nebula  
Omega Nebula  
Trifid Nebula  
Lagoon Nebula

**Kepler Search Space**

**3,000 light years**

Kepler  
100 deg<sup>2</sup> FOV

TESS  
40000 deg<sup>2</sup> FOV  
200 ly radius

**SUN**

North America  
Nebula

Cygnus Loop

California Nebula

Cone Nebula

Gum Nebula

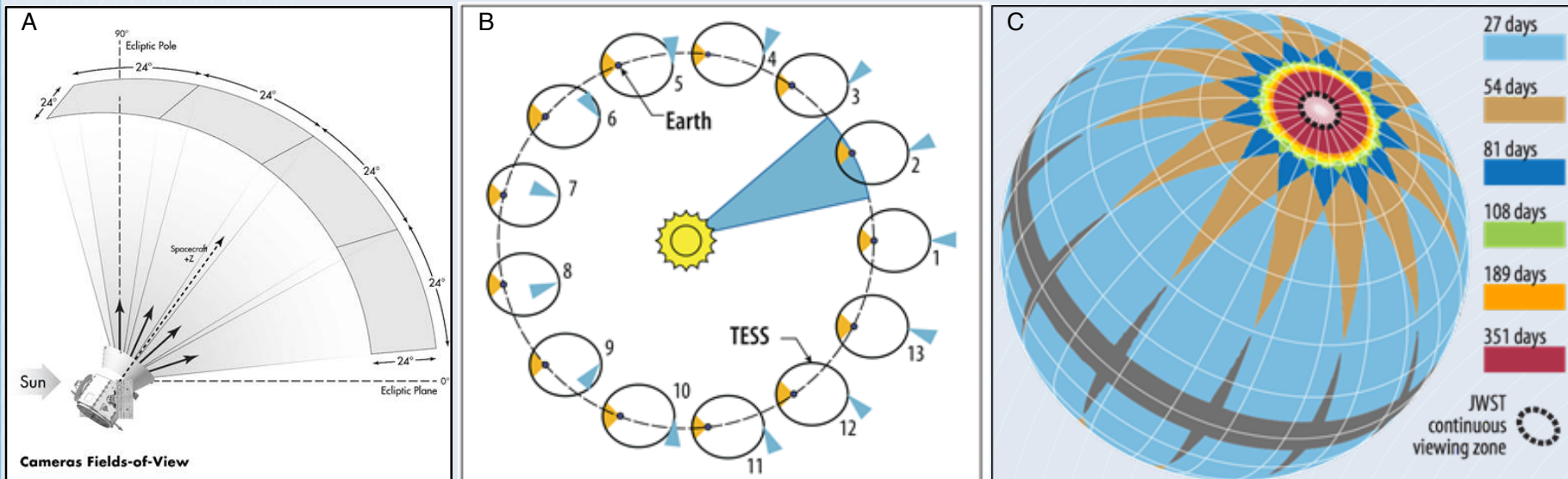
Crab Nebula

Orion Nebula

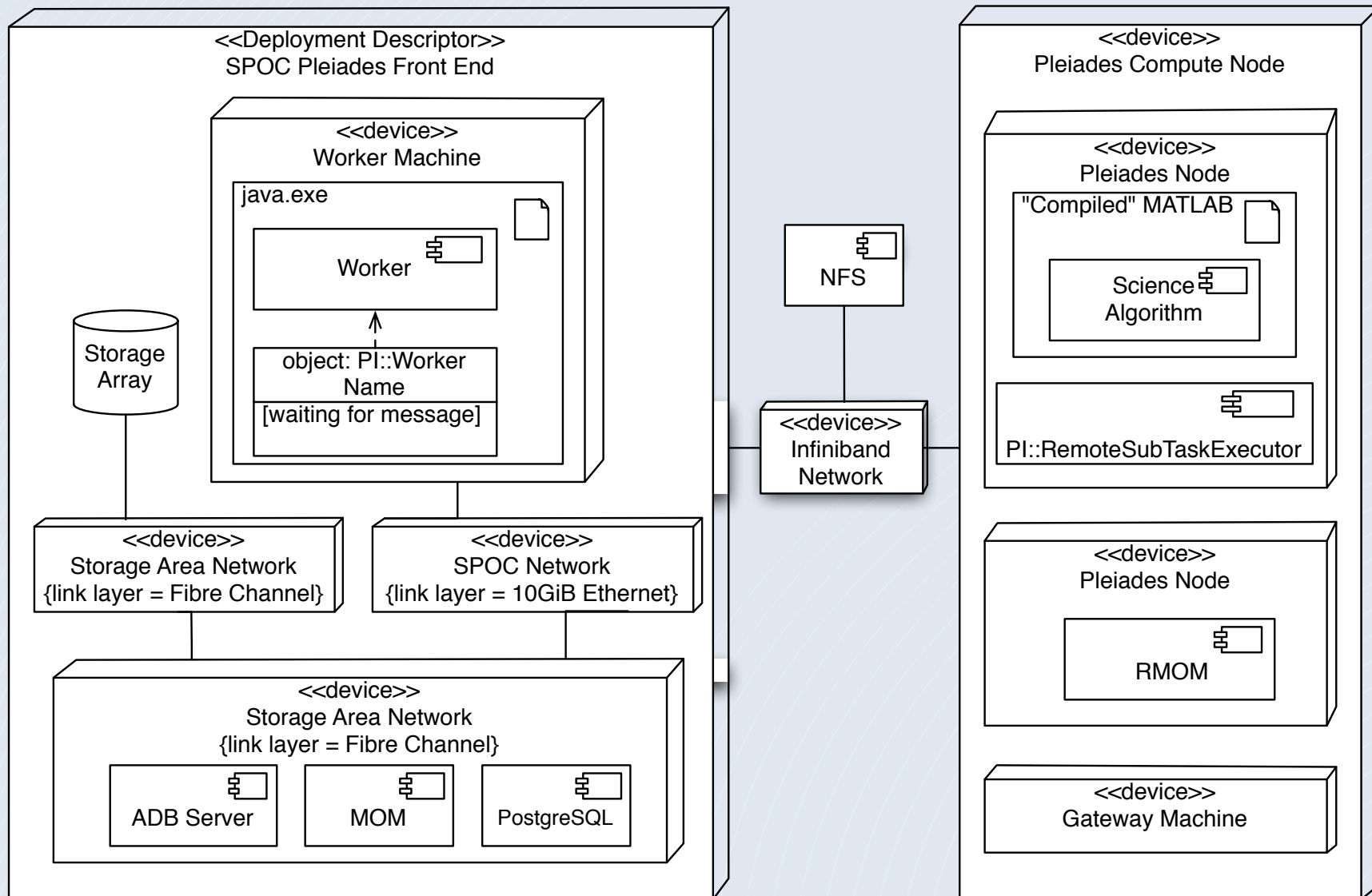
Rosette Nebula



- All sky transit survey to find Earth's closest cousins
- 2 year primary mission
- Launch in December 2017 (tentative)
- TESS will identify best planets for follow up and characterization with James Webb and very large telescopes



- Processing TESS data on the NAS

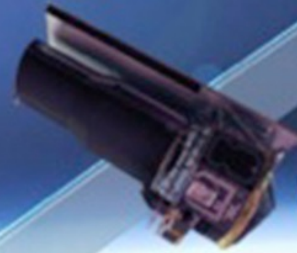




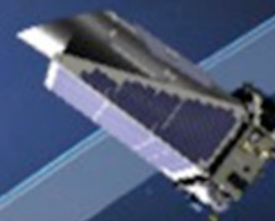
# Exoplanet Missions



Hubble



Spitzer



Kepler



TESS



JWST



New Worlds Telescope



WFIRST-AFTA

Ground-based Observatories



2001 Decadal Survey



2010 Decadal Survey

Supercomputing has played an increasingly important role in exoplanet searches, validation and characterization

The Kepler and TESS missions were and are not achievable without supercomputing

The role of supercomputers in exoplanet science is sure to grow in the future as the amount of data and sophistication of the software continue to increase with future missions