

Exoplanet Demographics:

Confronting Theory and Observations

Eric Nielsen

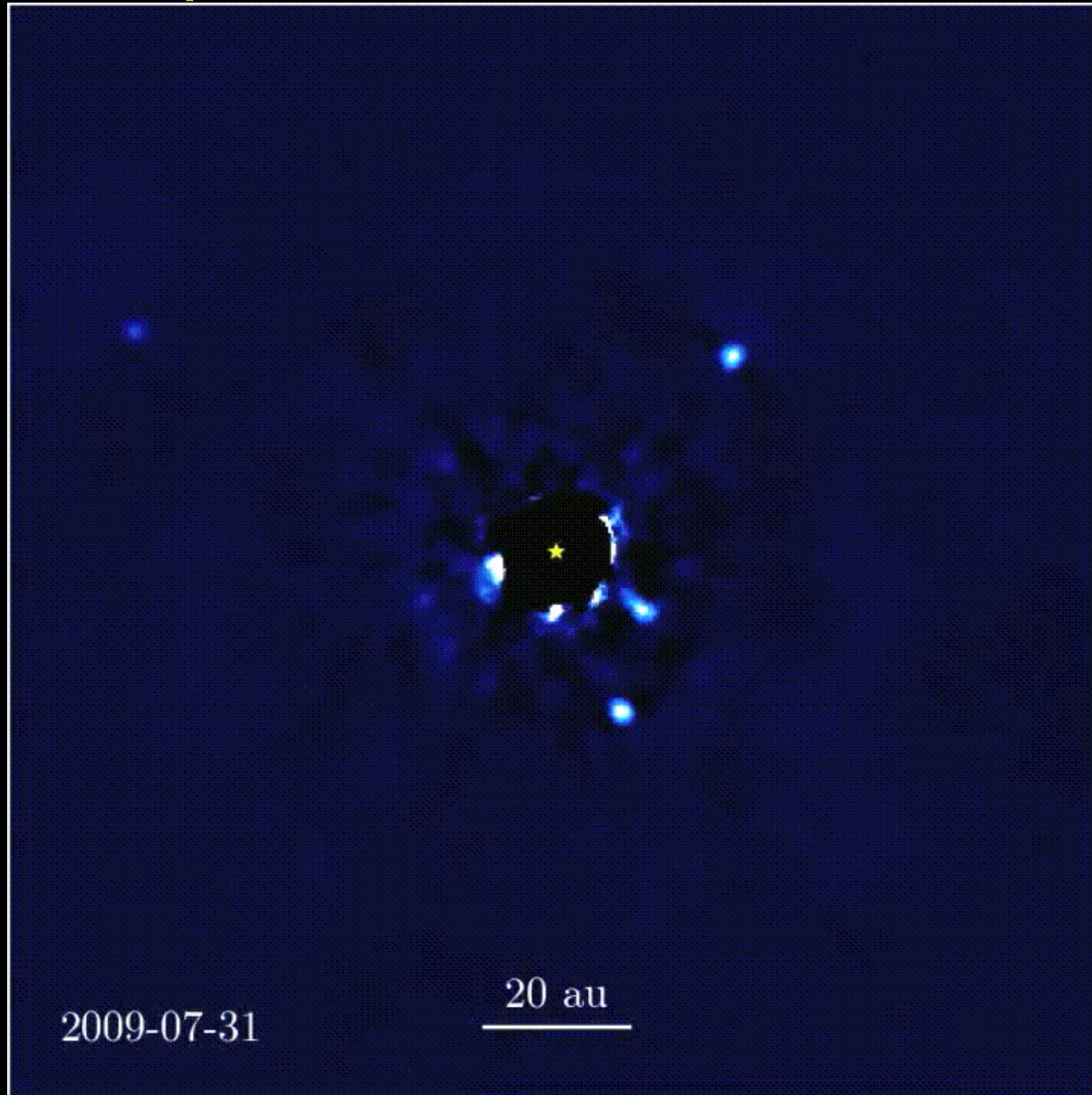
New Mexico State University



Sagan Summer Workshop

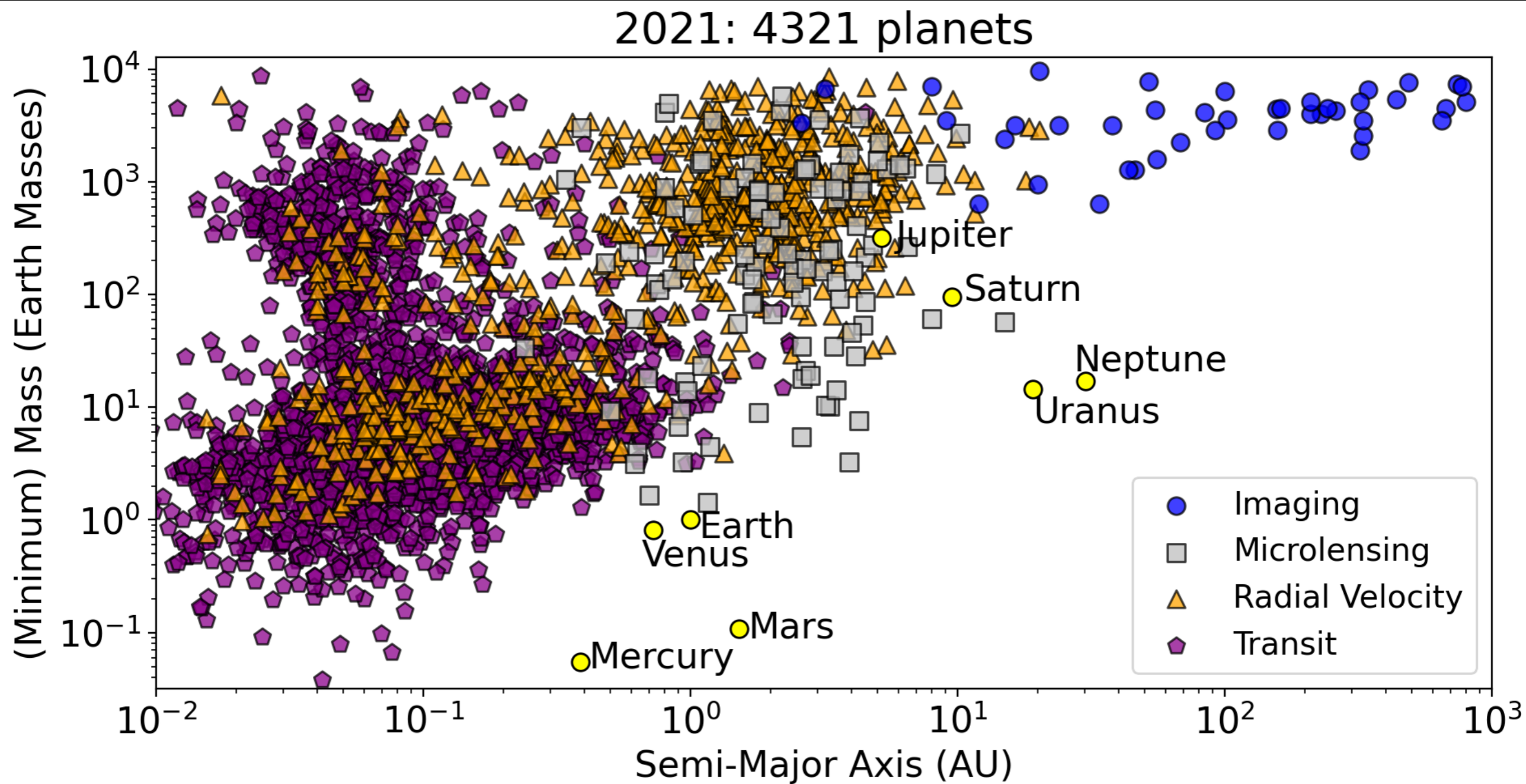
July 21, 2021

HR 8799: exoplanets in motion

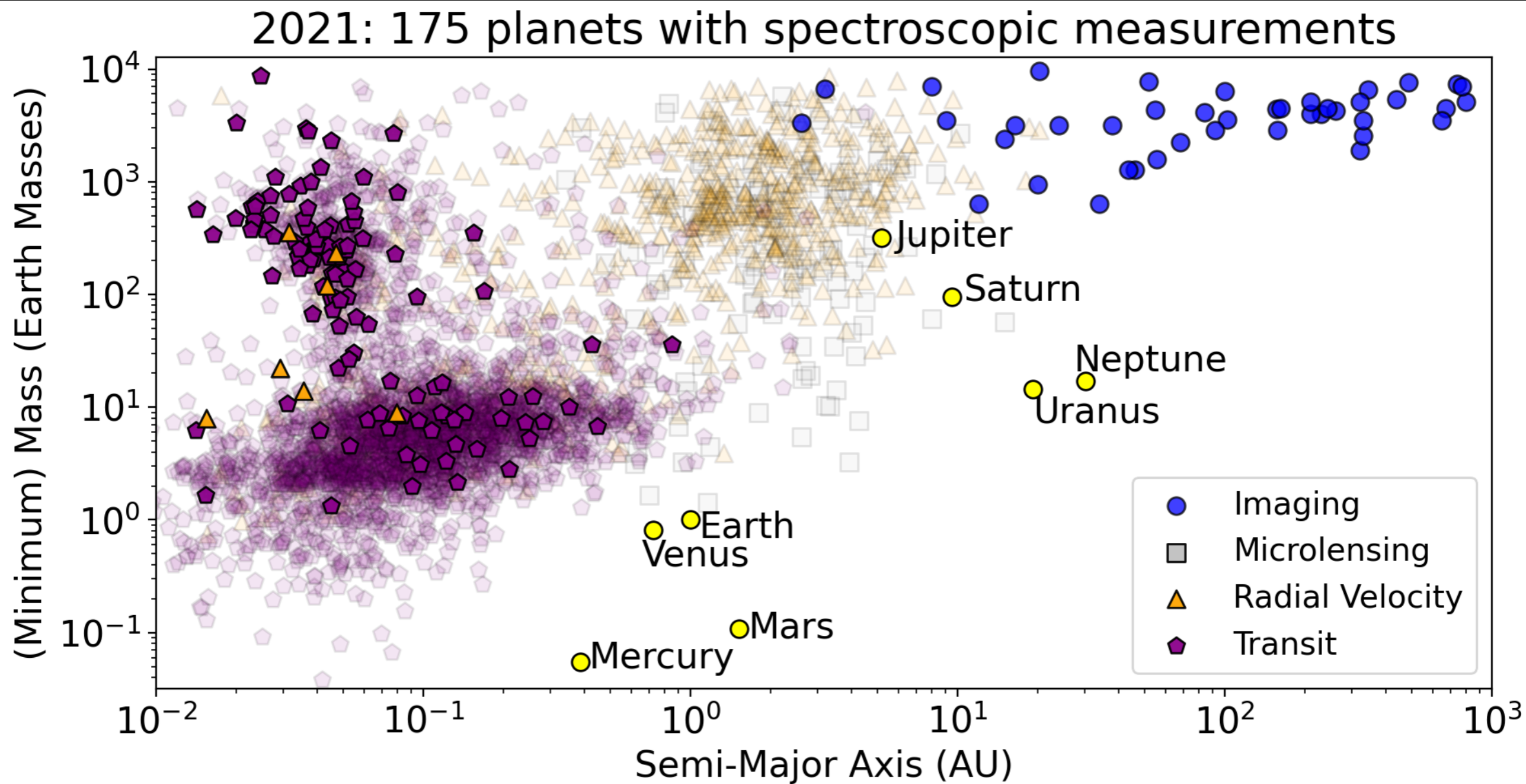


Movie from Jason Wang and Christian Marois

Exoplanet Populations



Exoplanet Populations



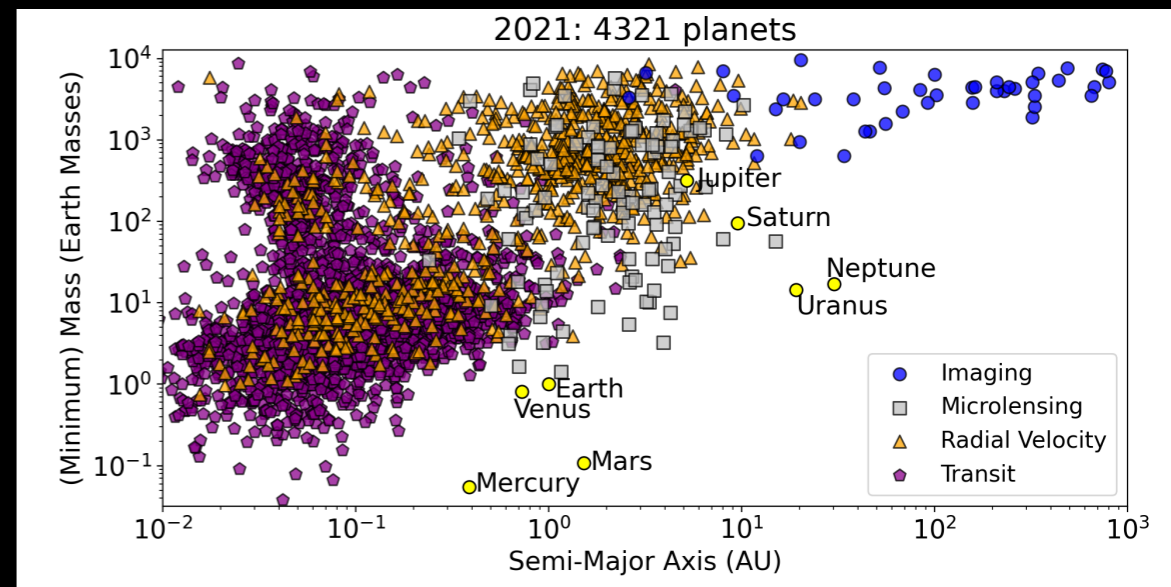
Exoplanet Demographics

What is the occurrence rate of planets?

How does that occurrence rate scale with system properties (planet mass, planet semi-major axis, stellar mass, stellar metallicity, ...)?

Demographics let us directly test models of planet formation and evolution

Make predictions for future instrumentation and surveys



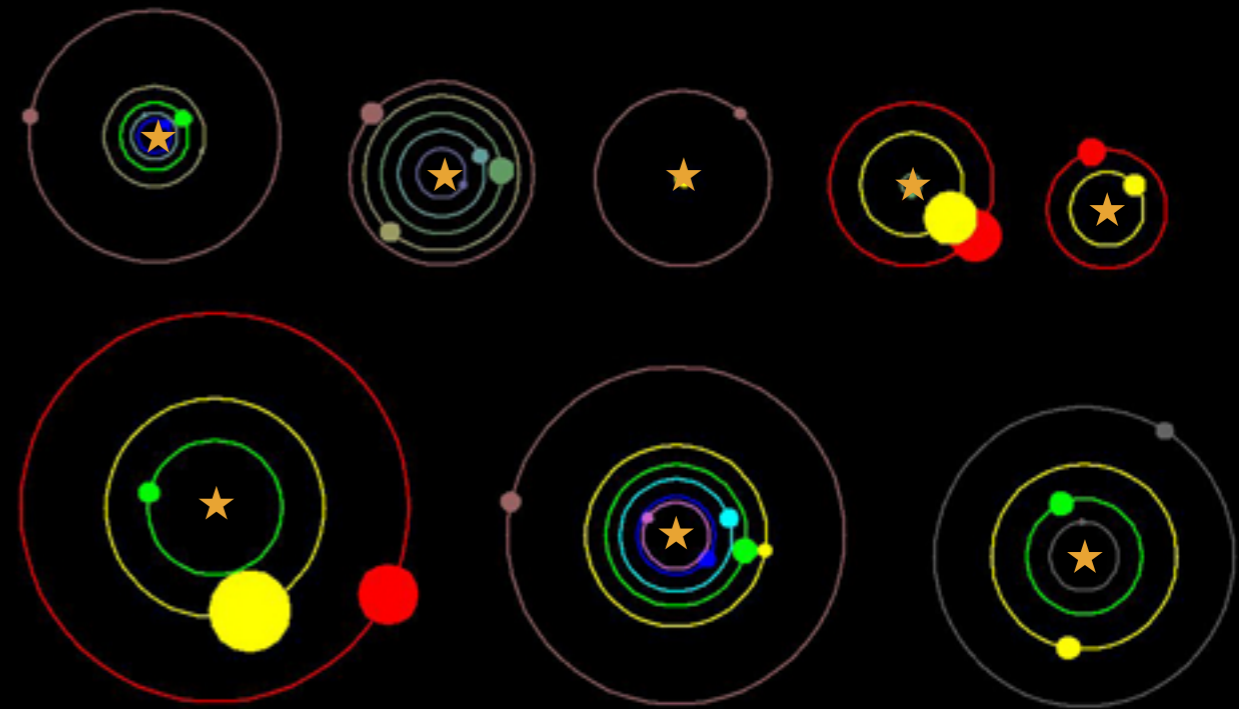
Dmitry Savransky/NASA Exoplanet Archive

Planet Occurrence and Planet Fraction

Planet Fraction: fraction of stars with planets

Planet Occurrence: number of planets per star

Both are often given over a specific range of parameters (e.g. 1-13 M_{Jup} , 10-100 AU, 1.5-2.5 M_{Sun})



Calculating Occurrence Rate and Planet Fraction

Planet Fraction:

Number of Stars with Planets

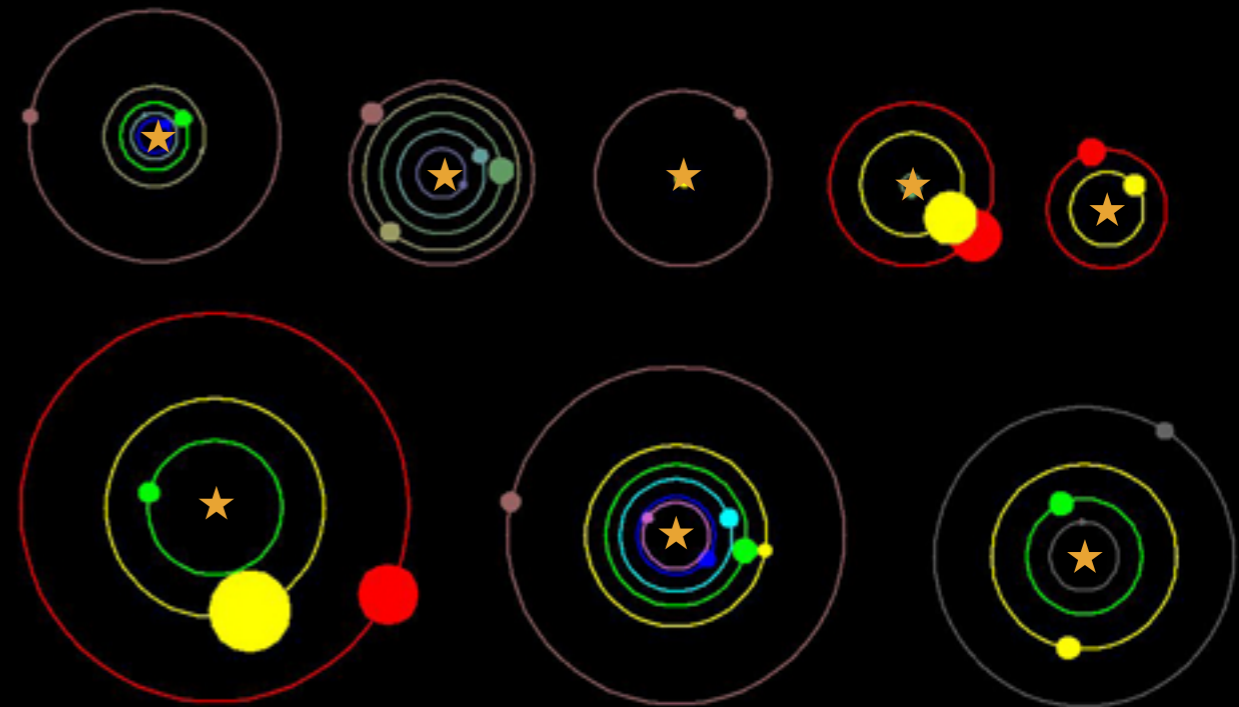
Total Number of Stars



Planet Occurrence:

Total Number of Planets

Total Number of Stars



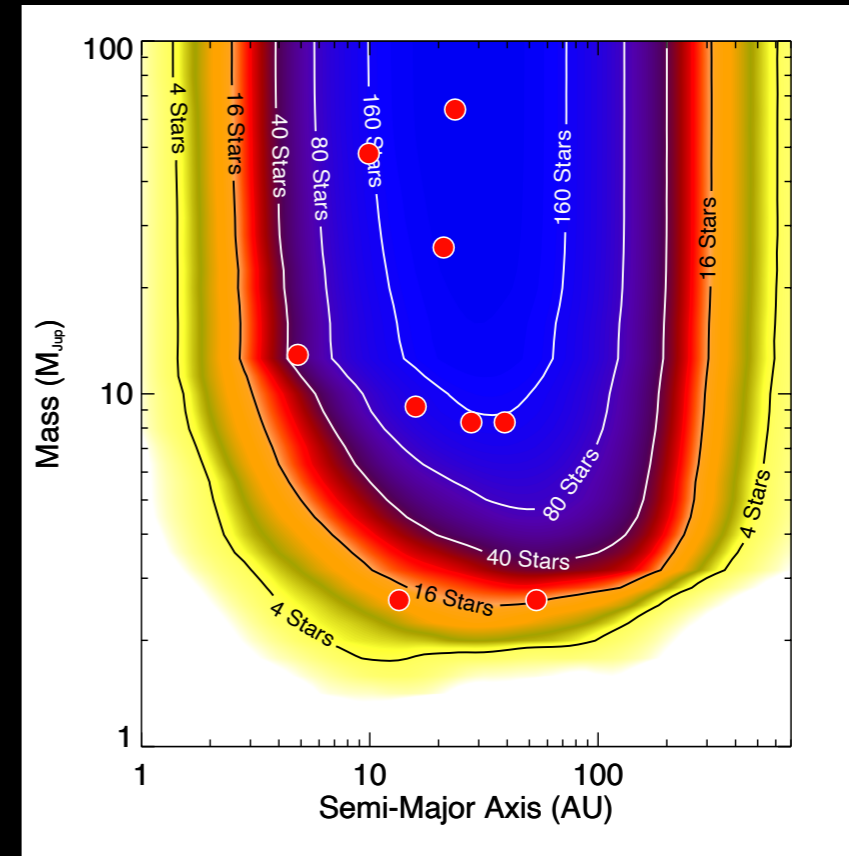
Completeness

Not all planets are equally easy to detect

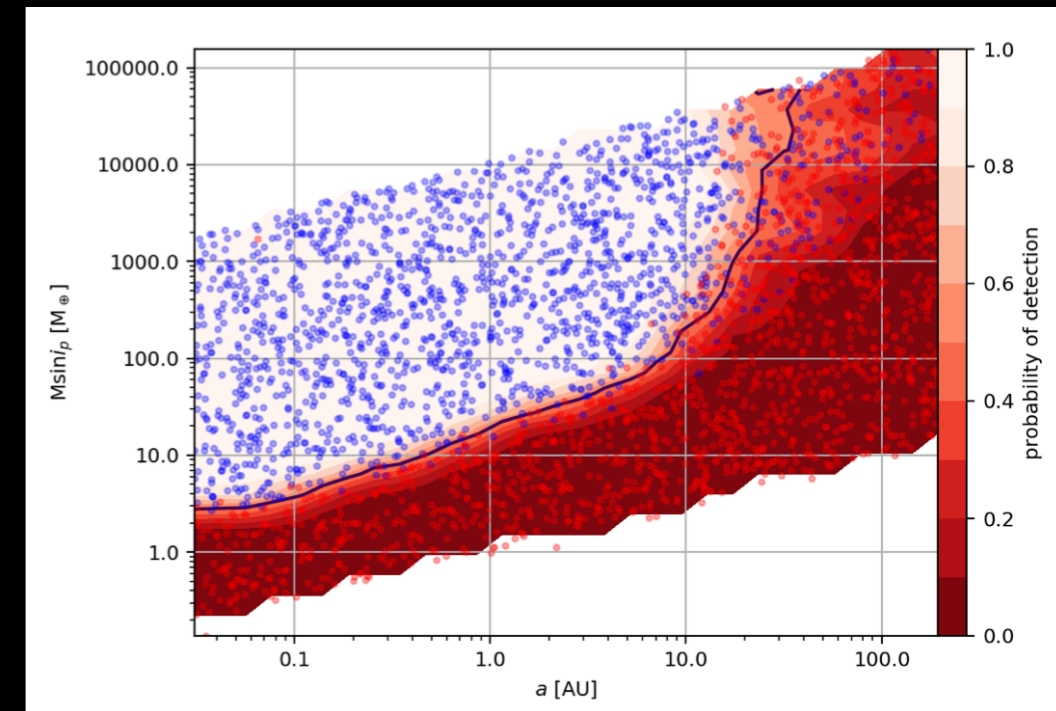
Each detection technique has its own biases

Important to accurately characterize survey completeness

Account for completeness when calculating occurrence or planet fraction



Nielsen et al. 2019

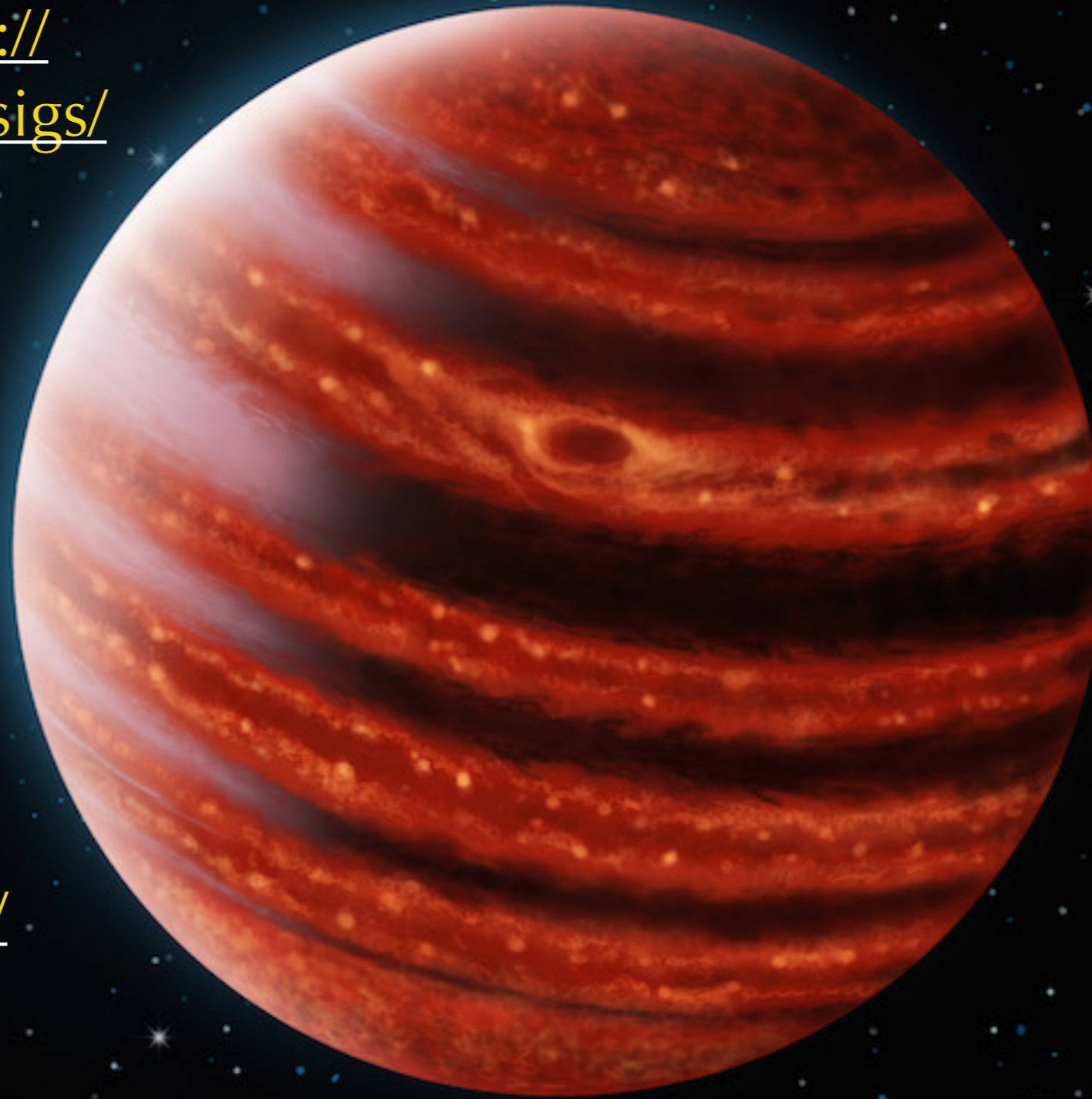


Rosenthal et al. 2021

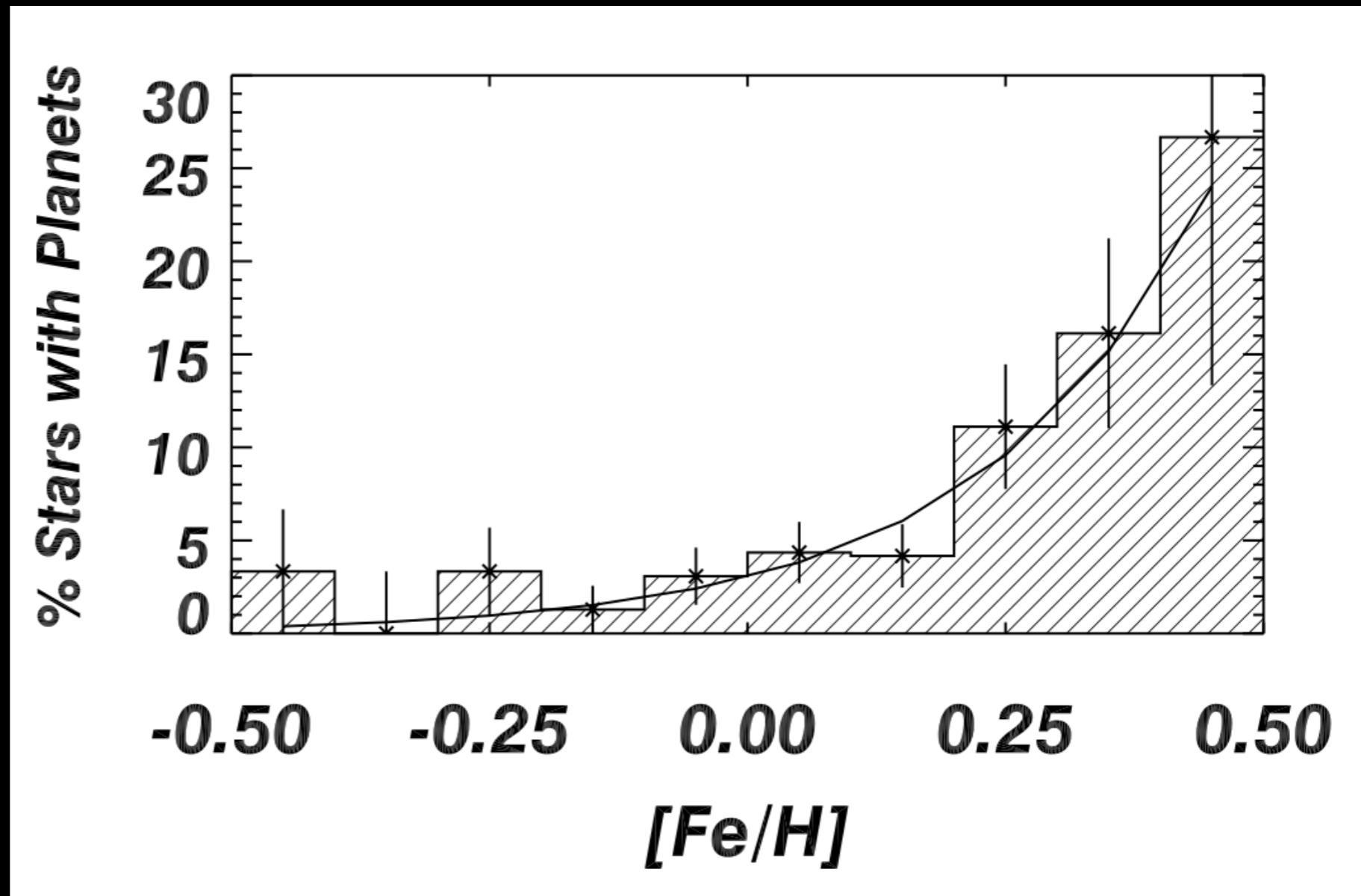
Exoplanet Demographics

NASA SIG2 (Science Interest Group)
on Exoplanet Demographics: [https://
exoplanets.nasa.gov/exep/exopag/sigs/](https://exoplanets.nasa.gov/exep/exopag/sigs/)

Exoplanet Demographics papers
on the NASA Exoplanet Archive:
[https://
exoplanetarchive.ipac.caltech.edu/
docs/occurrence_rate_papers.html](https://exoplanetarchive.ipac.caltech.edu/docs/occurrence_rate_papers.html)

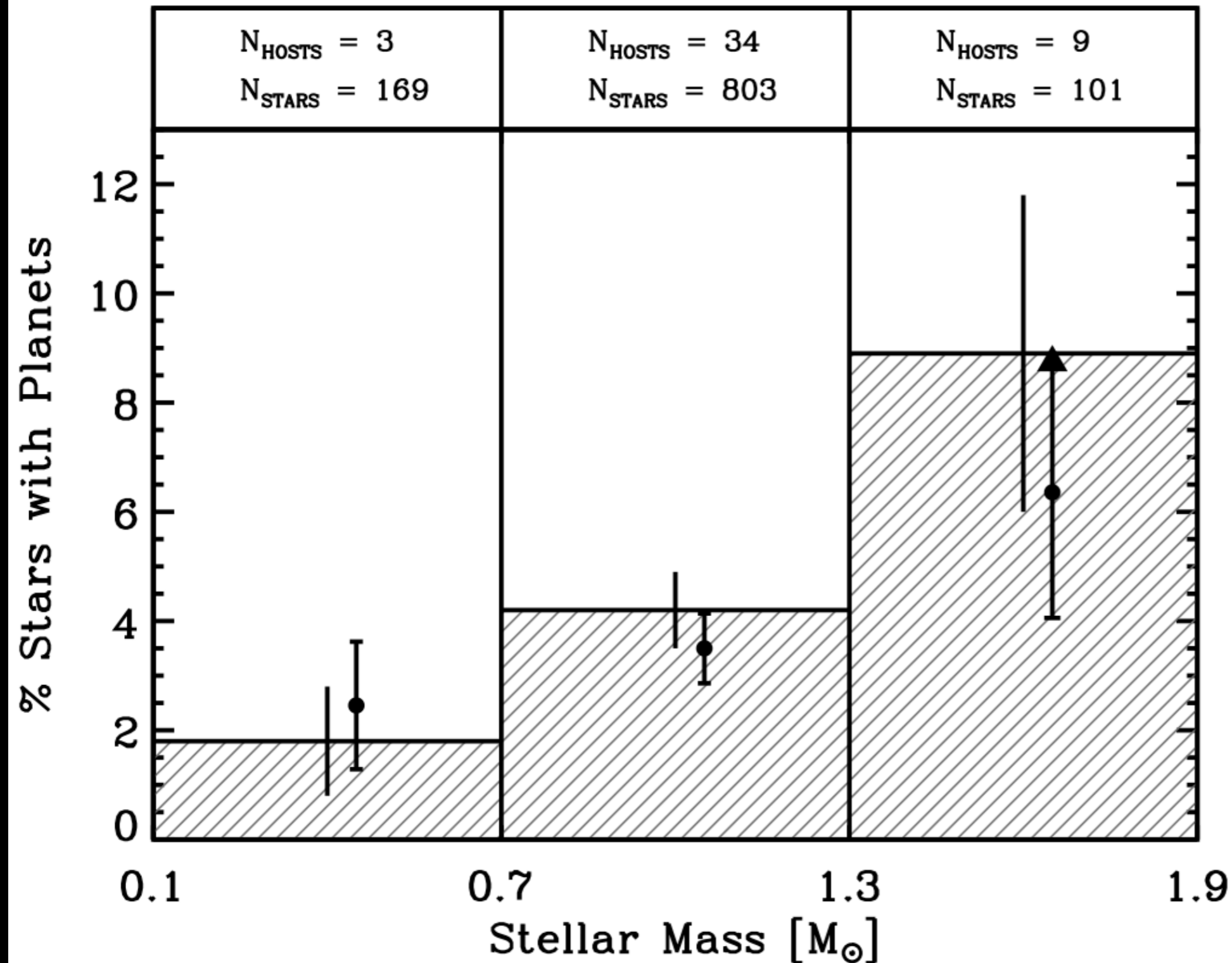


The giant planet/metallicity correlation

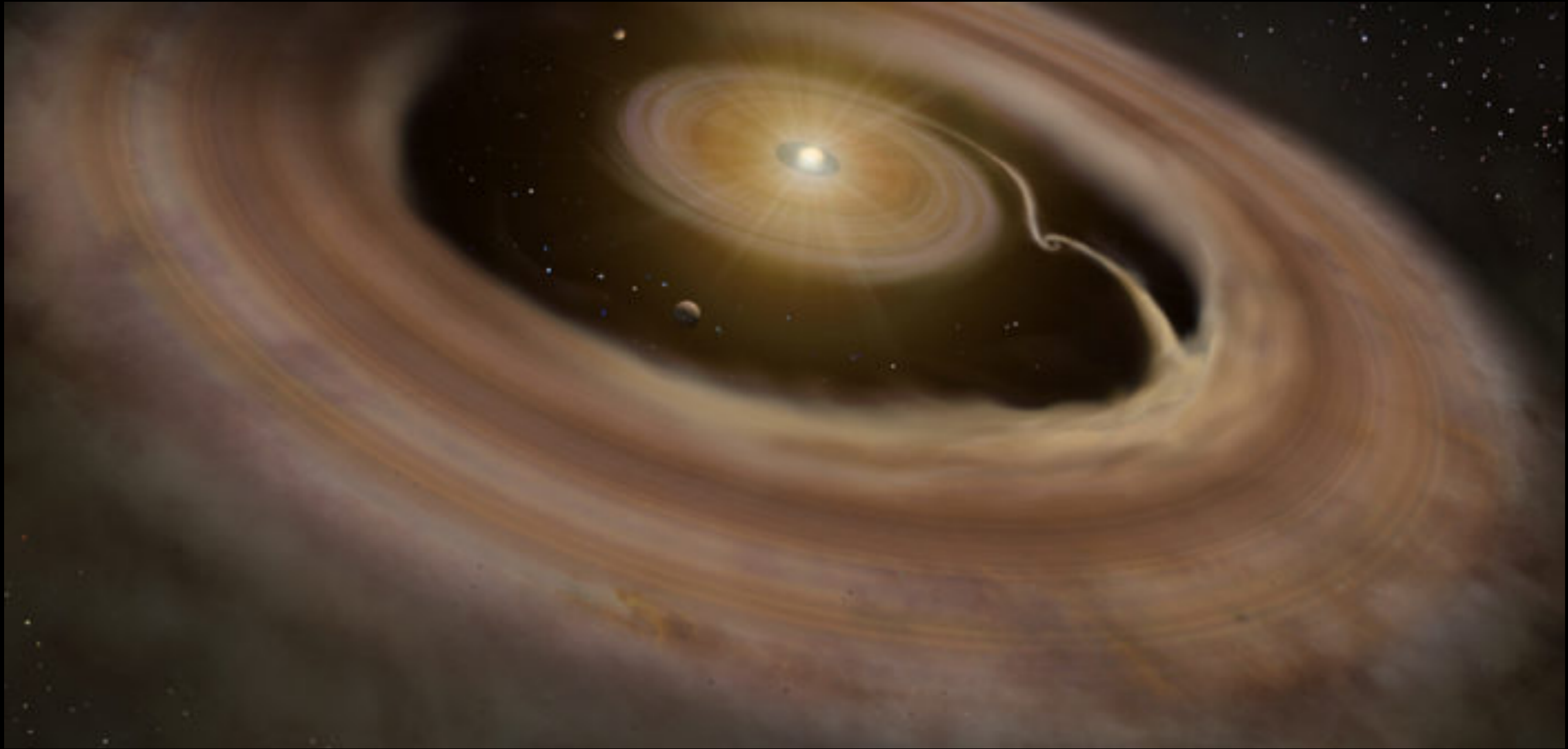


Fischer & Valenti 2005

The giant planet/host mass correlation



Giant Planet Formation



The Graduate Institute for Advanced Studies/NOAJ

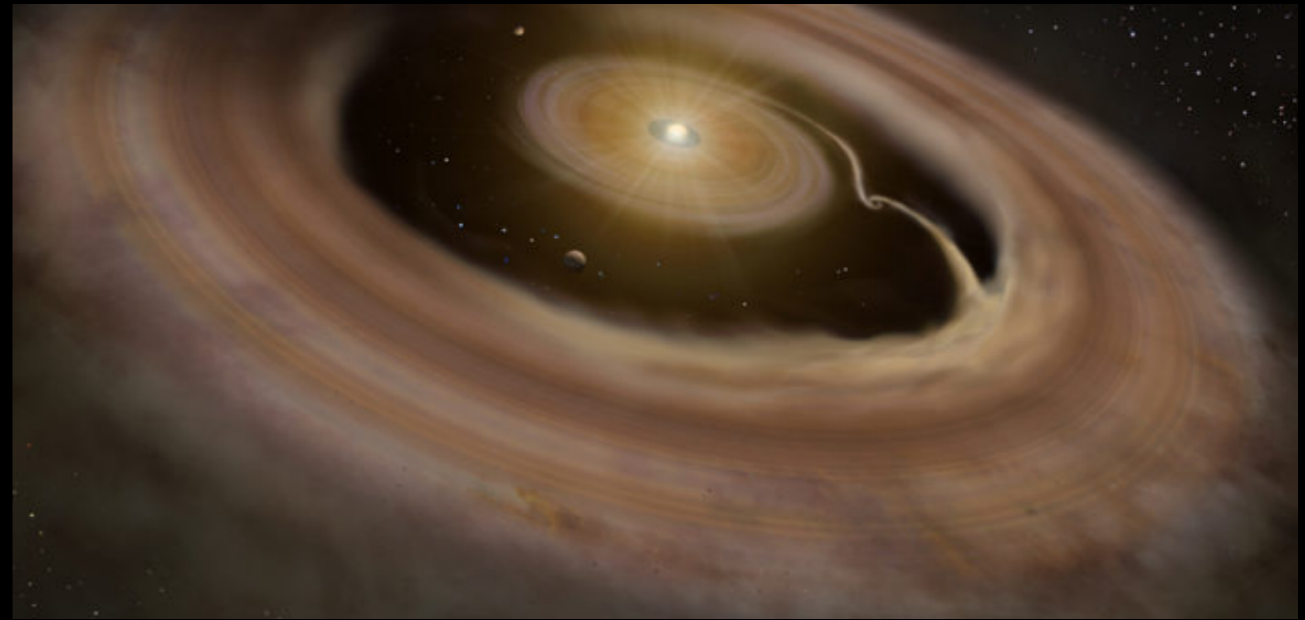
Bottom-up: Core Accretion

Step 1: Accrete 10 Earth masses of solids



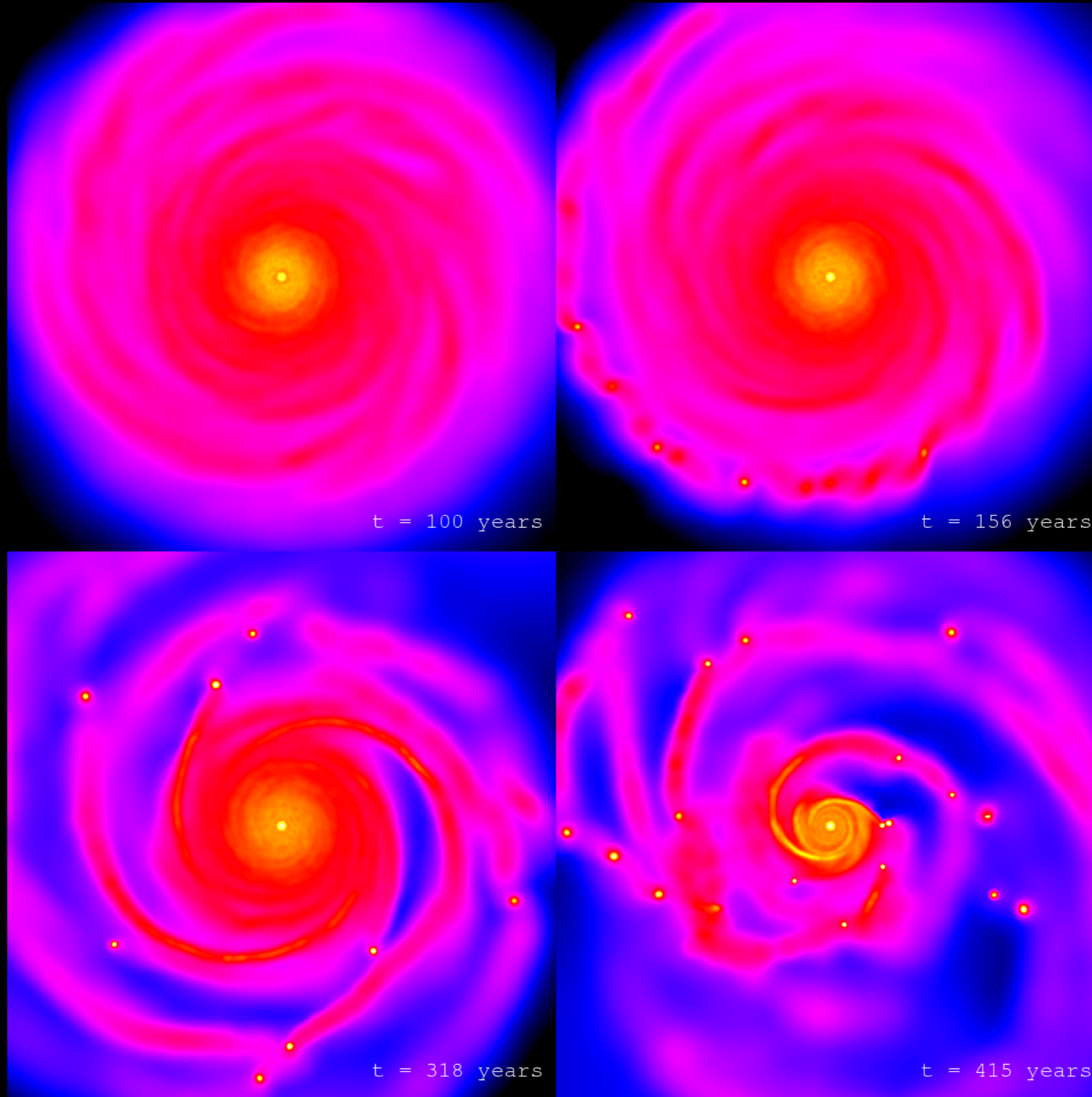
Alan Brandon/Nature

Step 2: Pull 300 Earth masses of gas from disk



The Graduate Institute for
Advanced Studies/NOAJ

Top-down: Gravitational Instability



G. Lufkin et al.

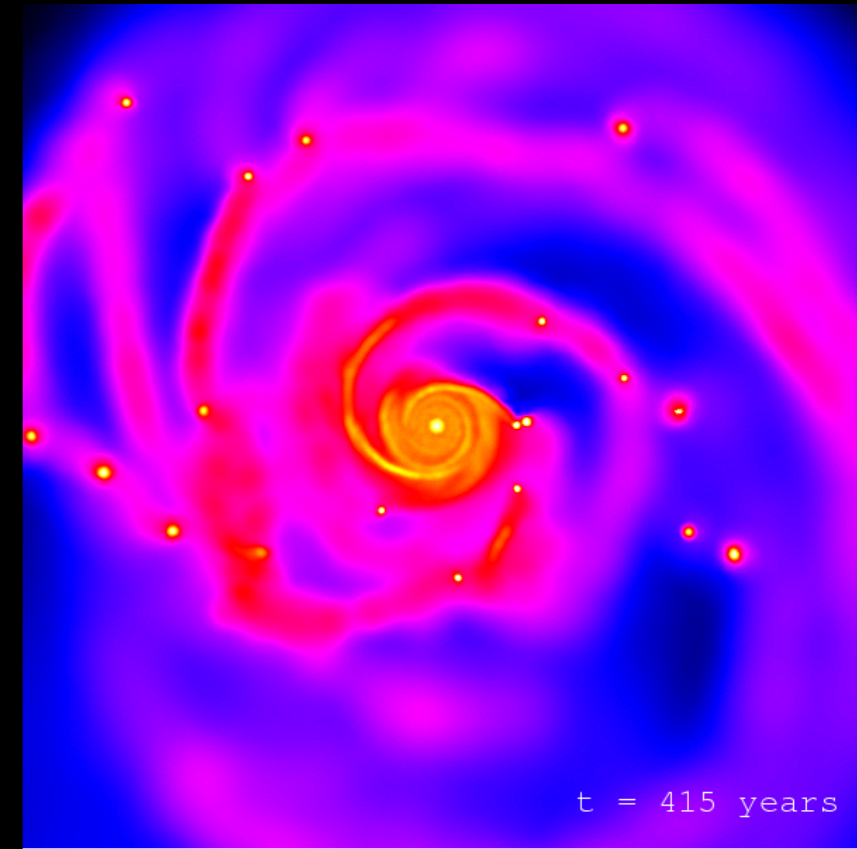
Comparing to theory



Core accretion

Predicts more giant planet cores forming at higher metallicity

Predicts more giant planets orbiting higher mass stars

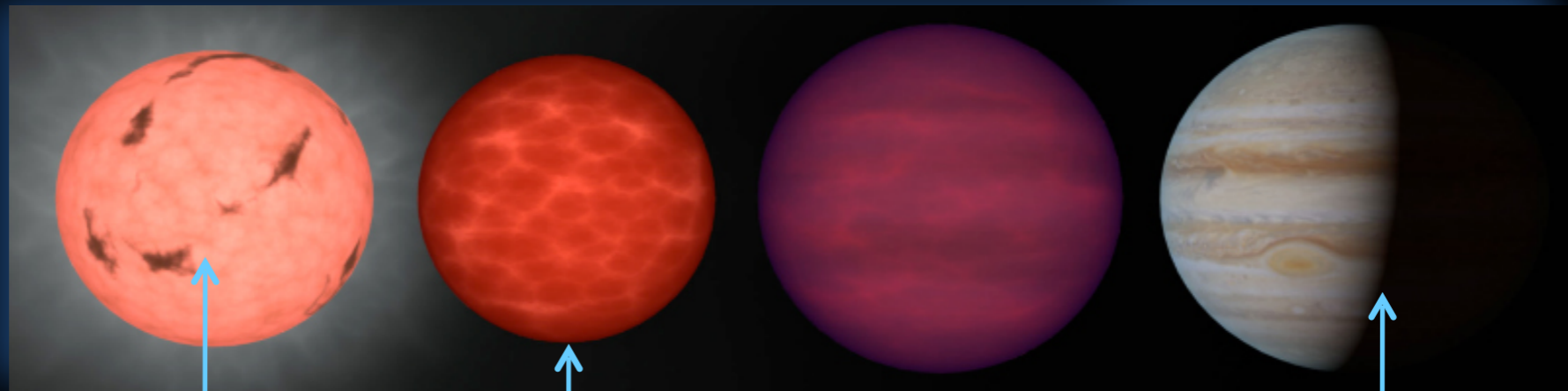


Gravitational Instability





Young planets are the easiest to see



New planet:
3000°C

10 million years:
2000°C

100 million years: 1000°C

4600 million years: -145°C

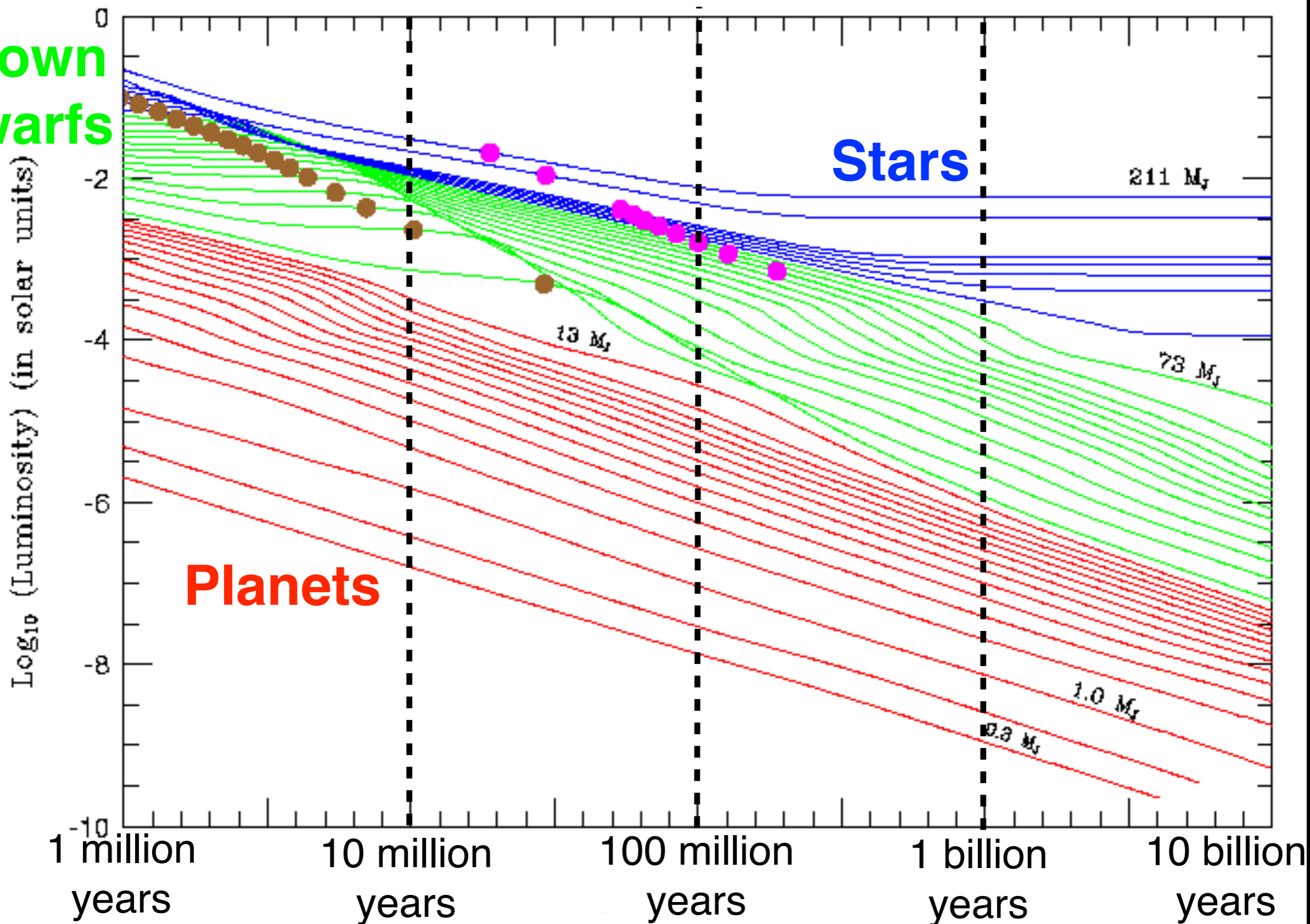
NASA/IPAC/R. Hurt (SSC)

Cooling with time

**Brown
Dwarfs**

Stars

Planets

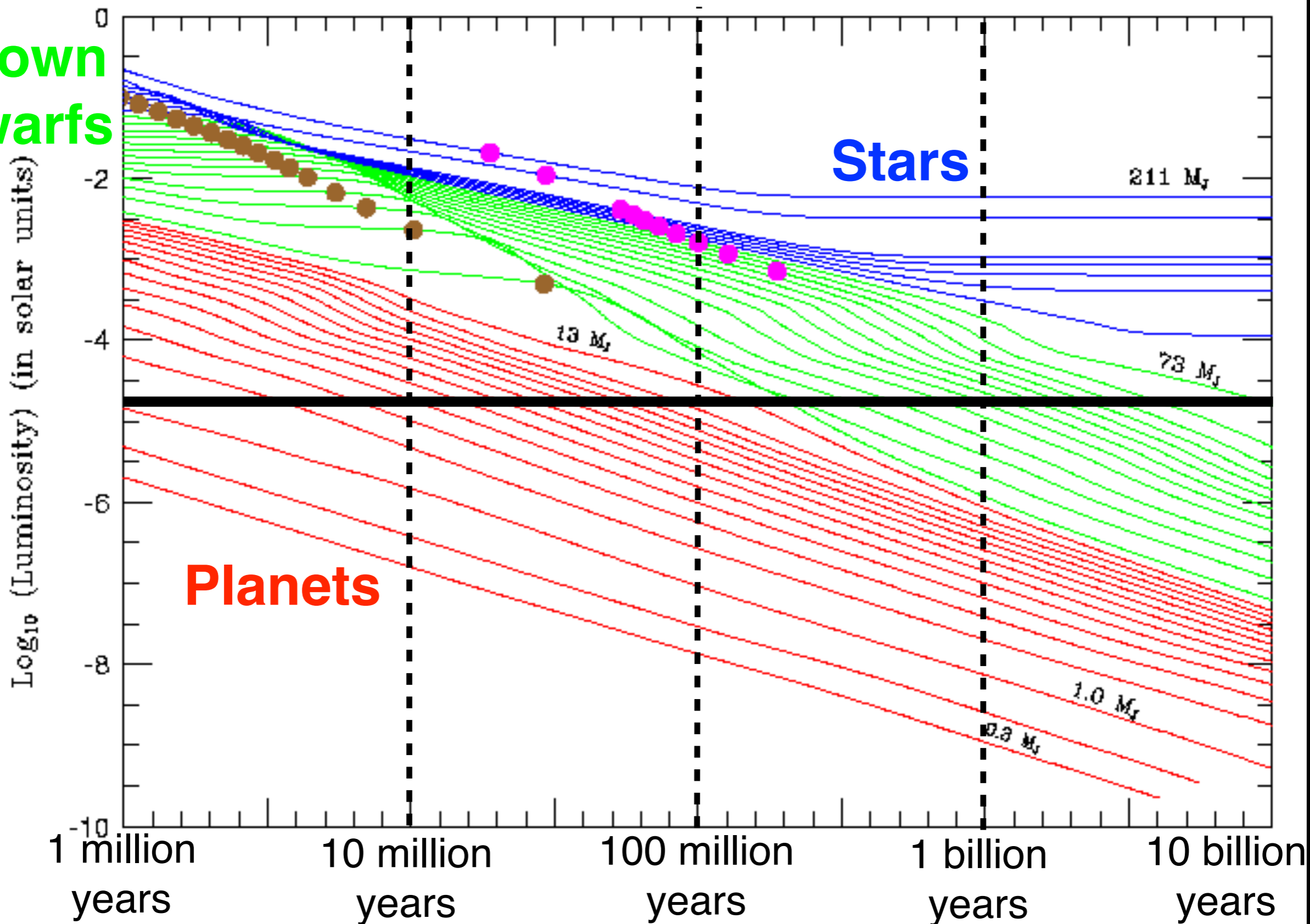


Cooling with time

**Brown
Dwarfs**

Stars

Planets



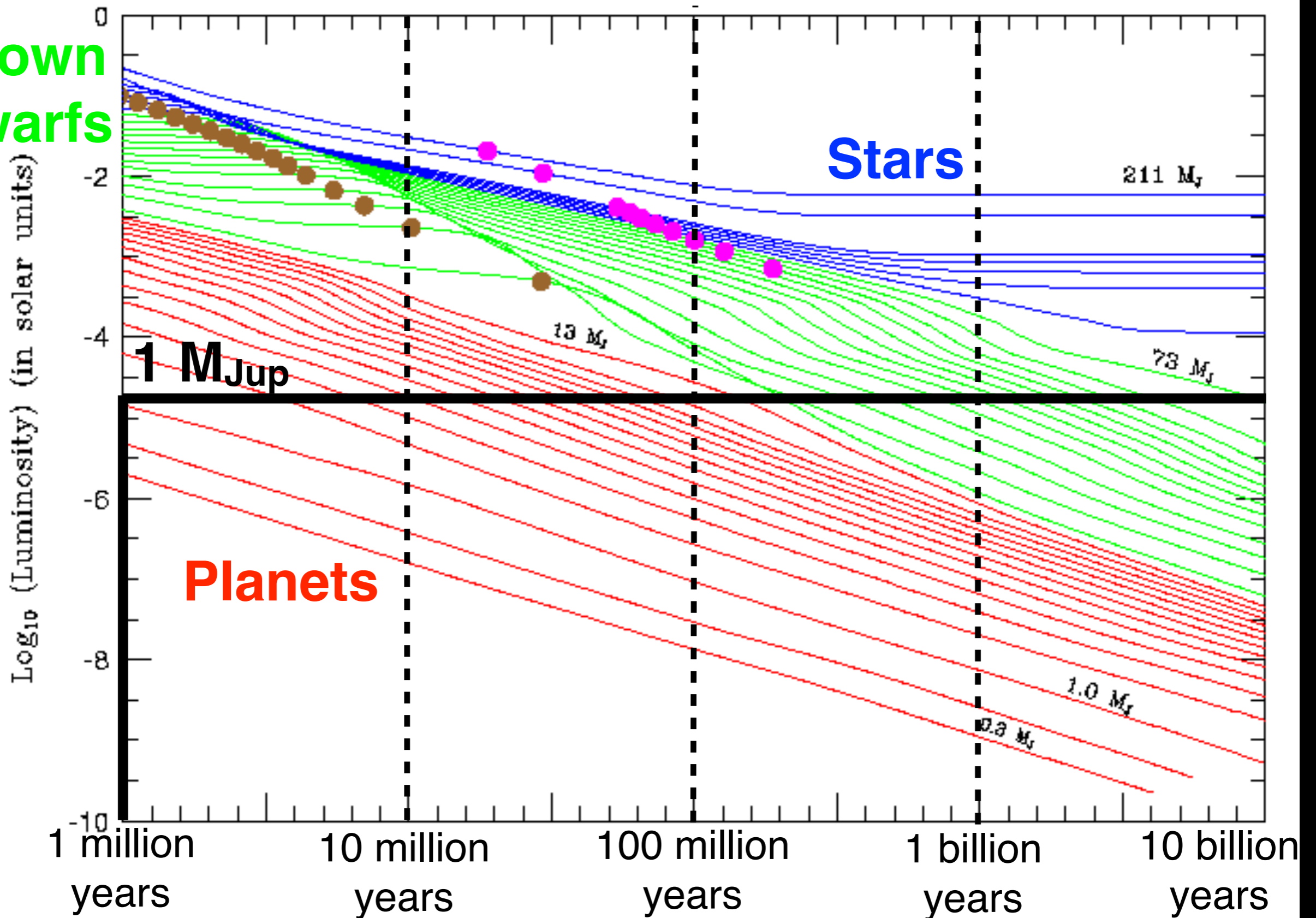
Cooling with time

**Brown
Dwarfs**

Stars

1 M_{Jup}

Planets

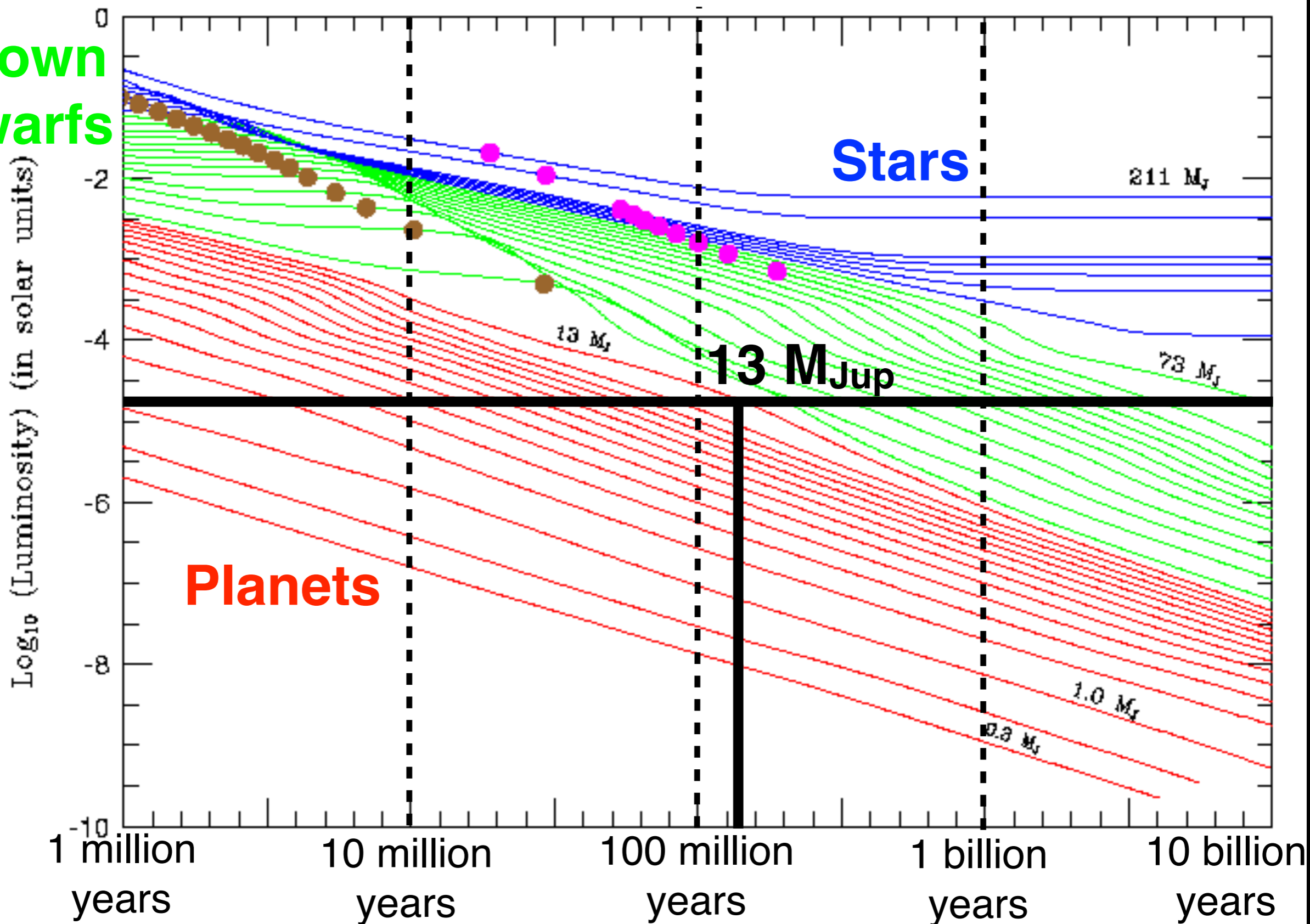


Cooling with time

**Brown
Dwarfs**

Stars

Planets

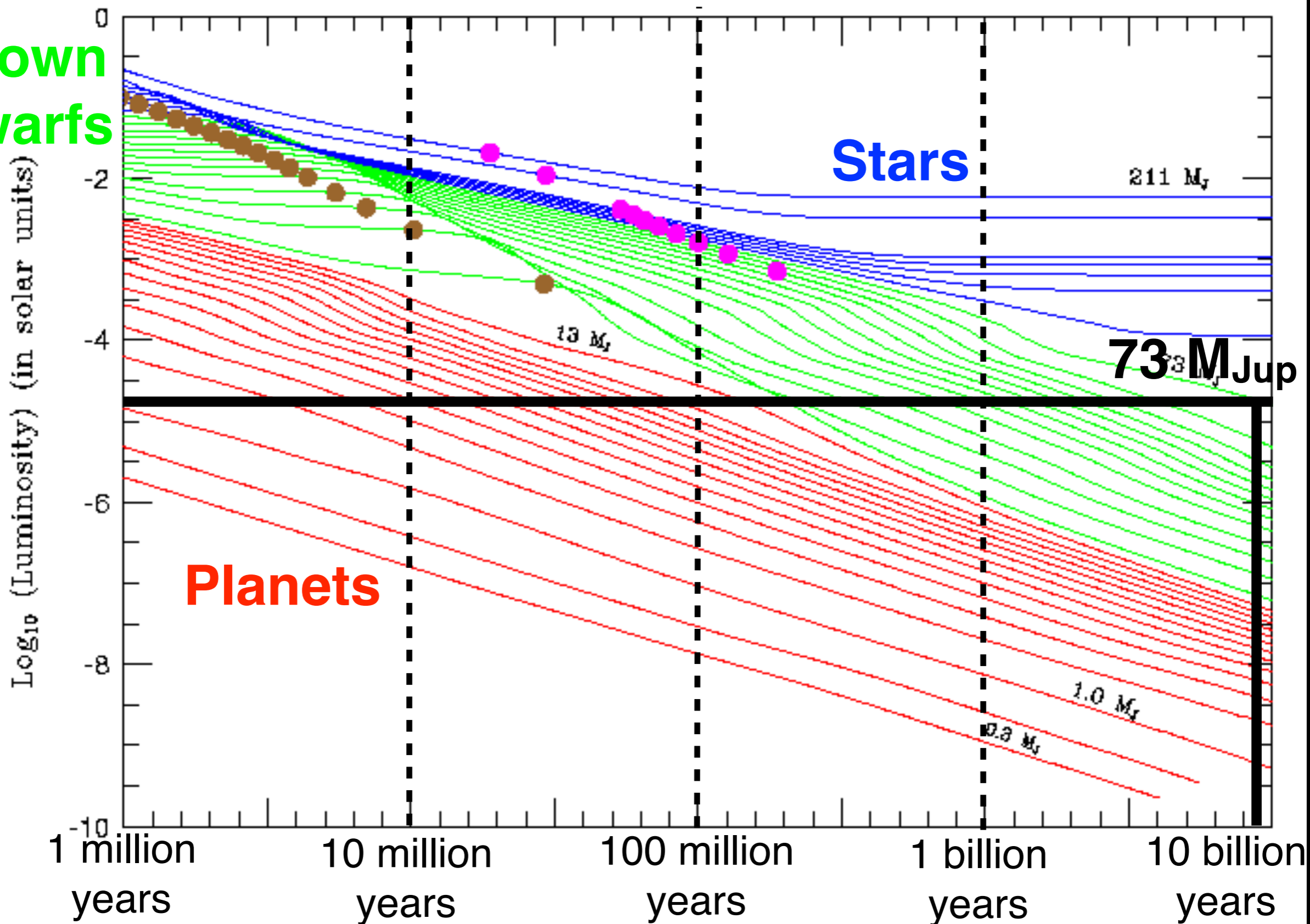


Cooling with time

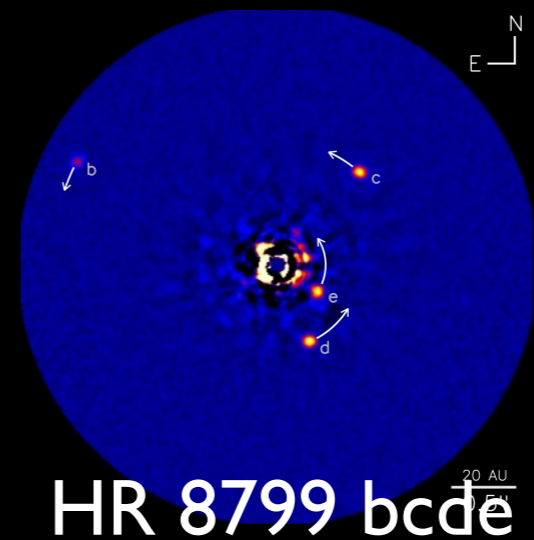
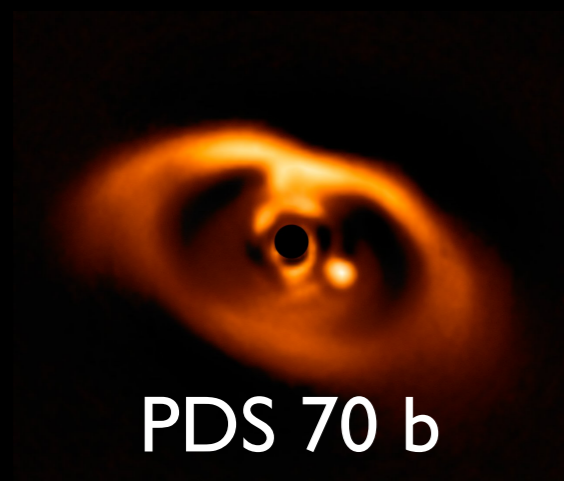
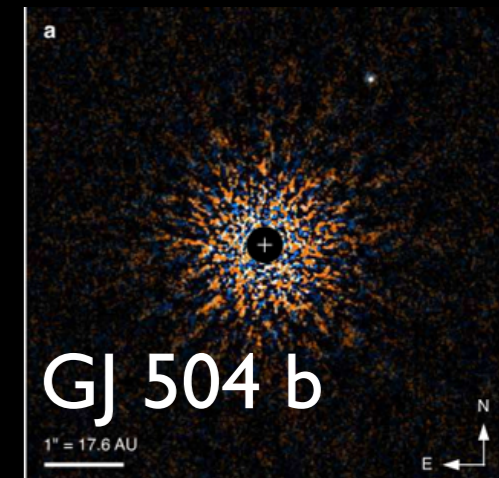
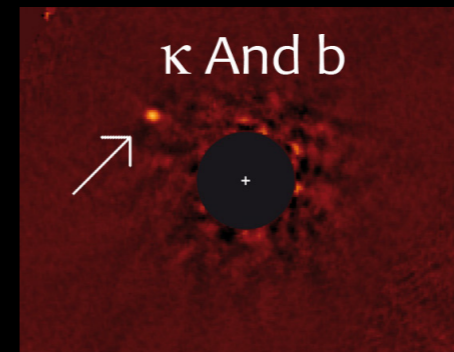
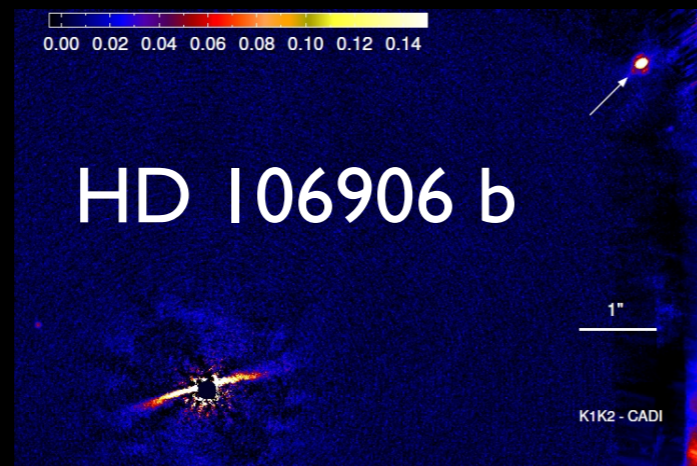
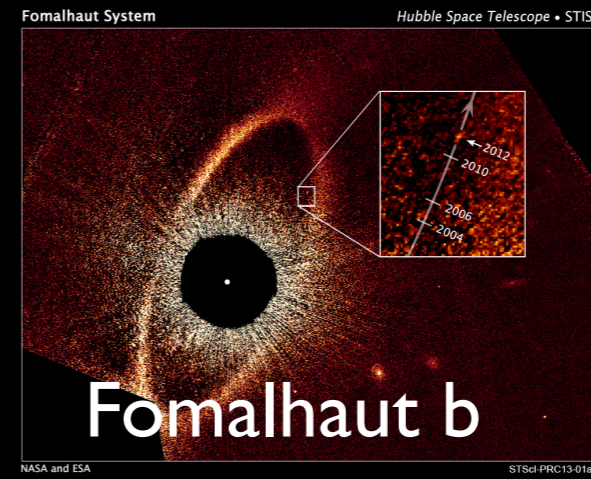
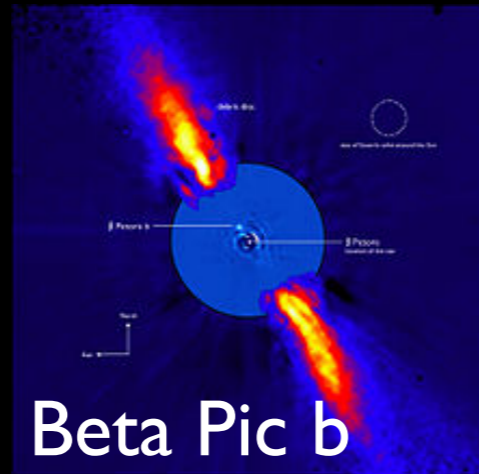
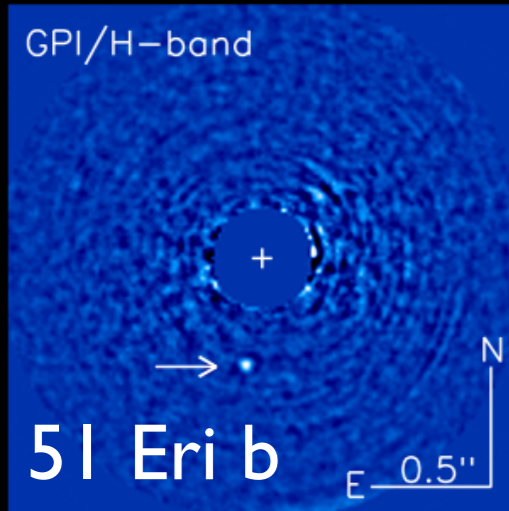
**Brown
Dwarfs**

Stars

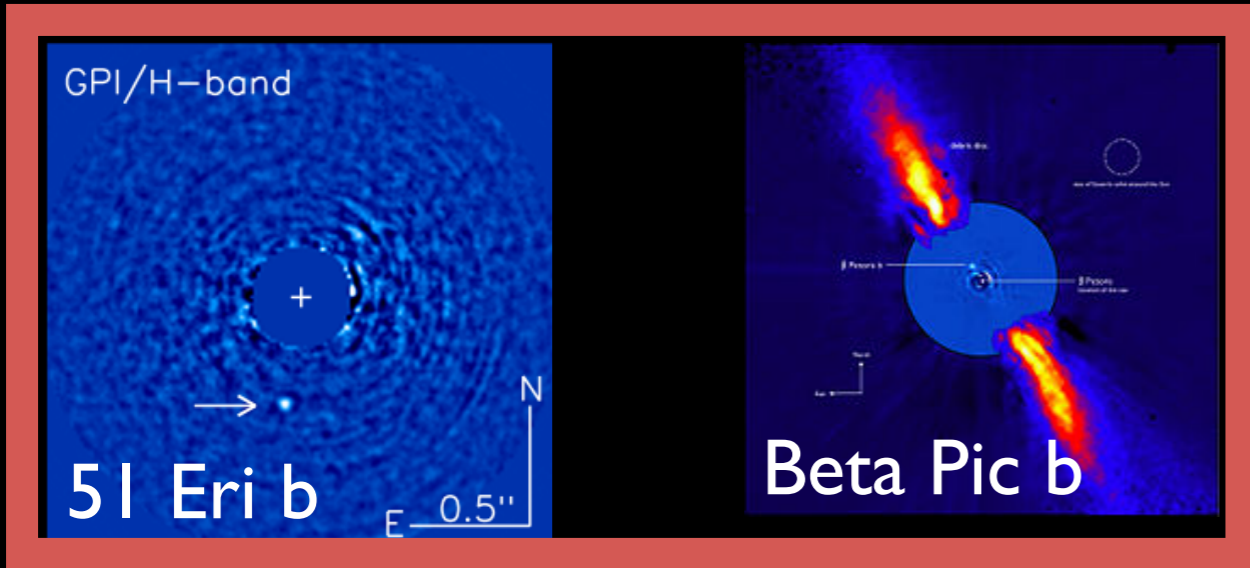
Planets



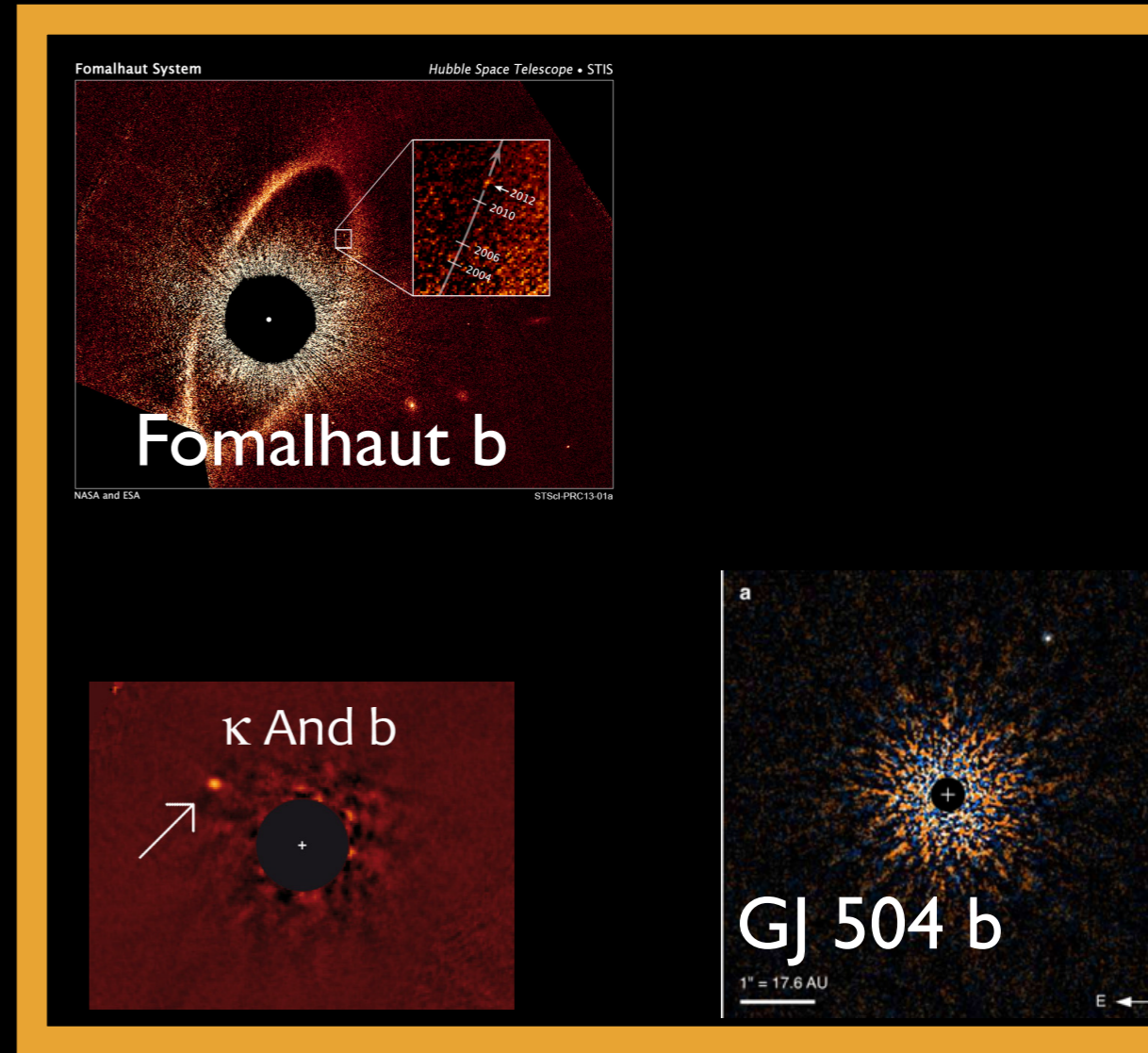
Directly Imaged Planets



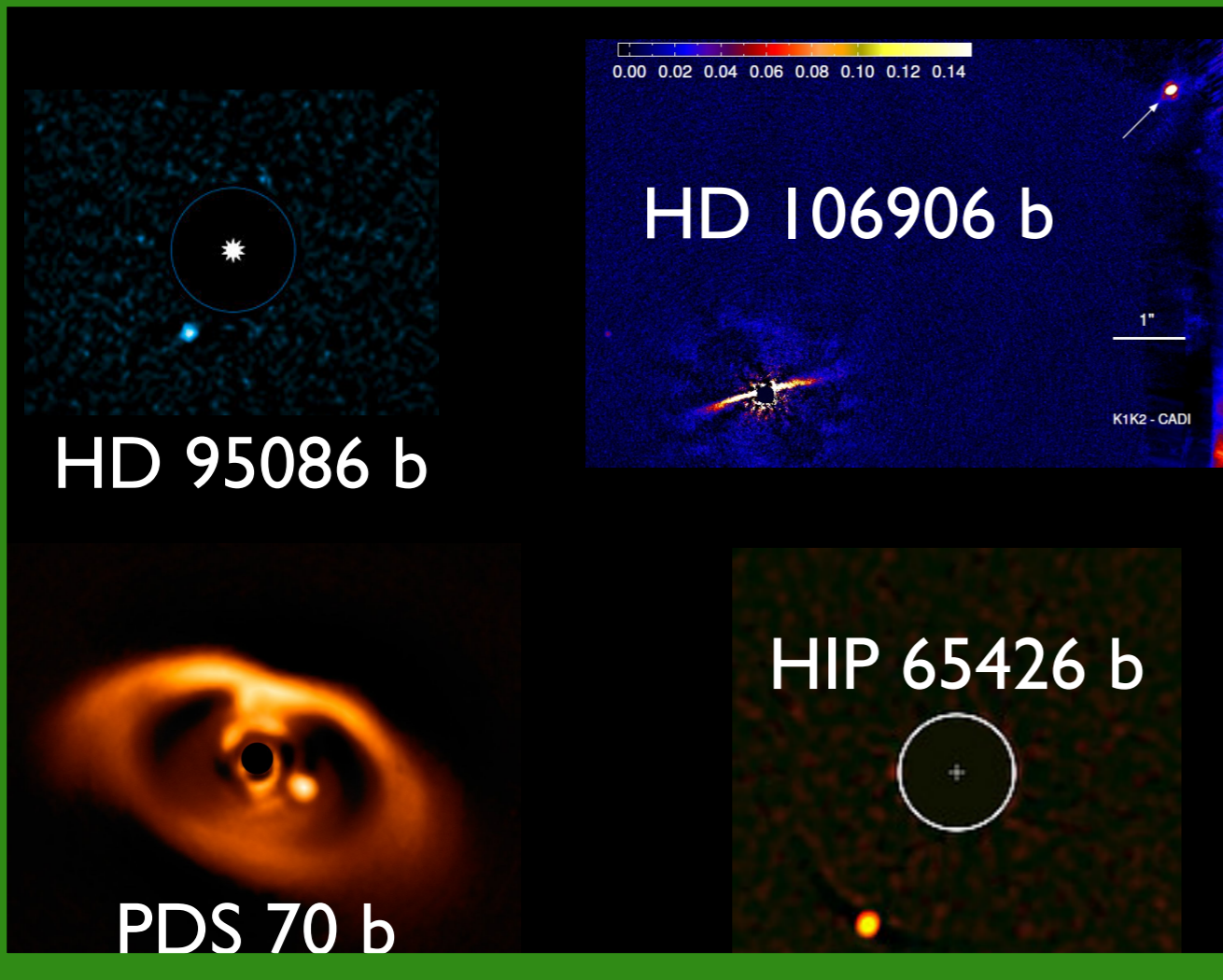
Directly Imaged Planets



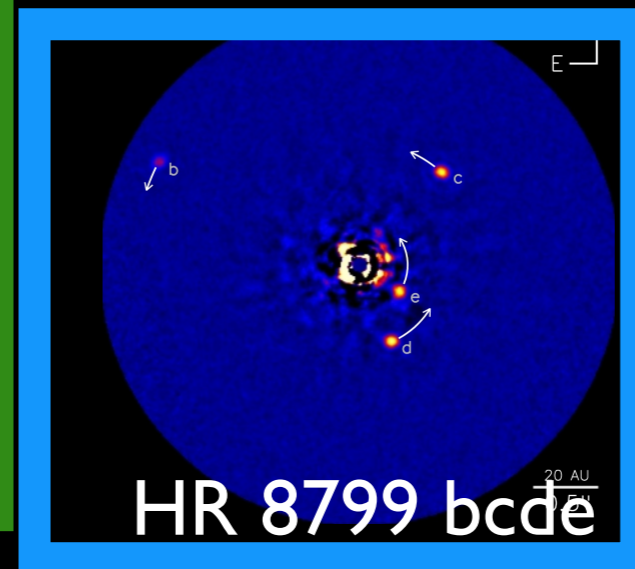
Beta Pic Moving Group



Field Stars



Sco/Cen Association

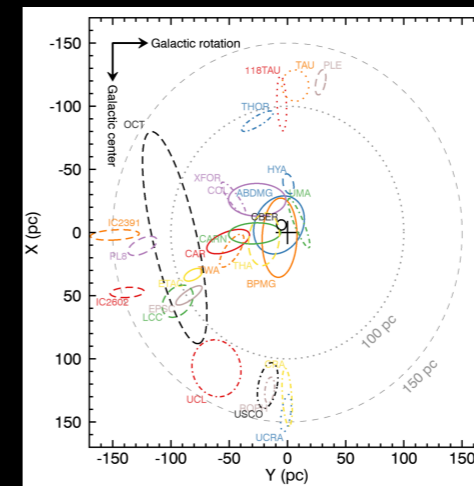


Columba Association

Ages of Stars

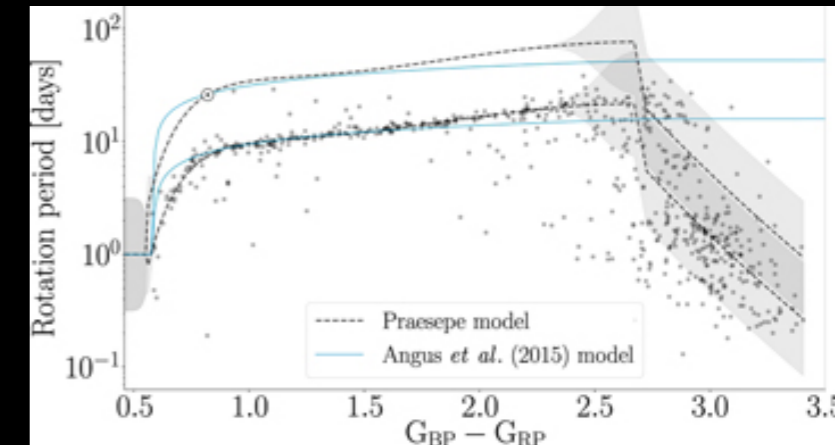
Moving group stars:

BANYAN (<http://www.exoplanetes.umontreal.ca/banyan/>, Gagne et al. 2018)



Gagne et al. 2018

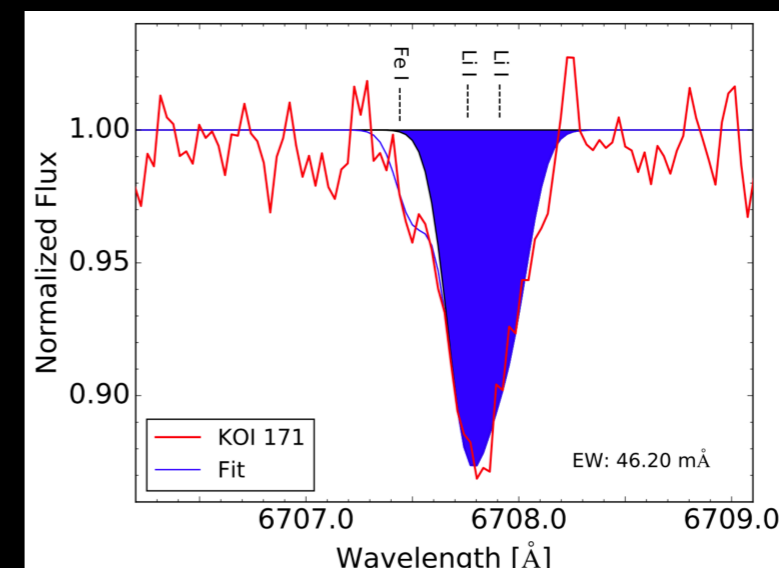
LACEwing (<https://github.com/ariedel/lacewing>, Riedel et al. 2017)



Angus et al. 2019

Field stars:

Rotation and Isochrones: stardate (<https://github.com/RuthAngus/stardate>, Angus et al. 2019)



Berger, Howard, & Boesgaard 2018

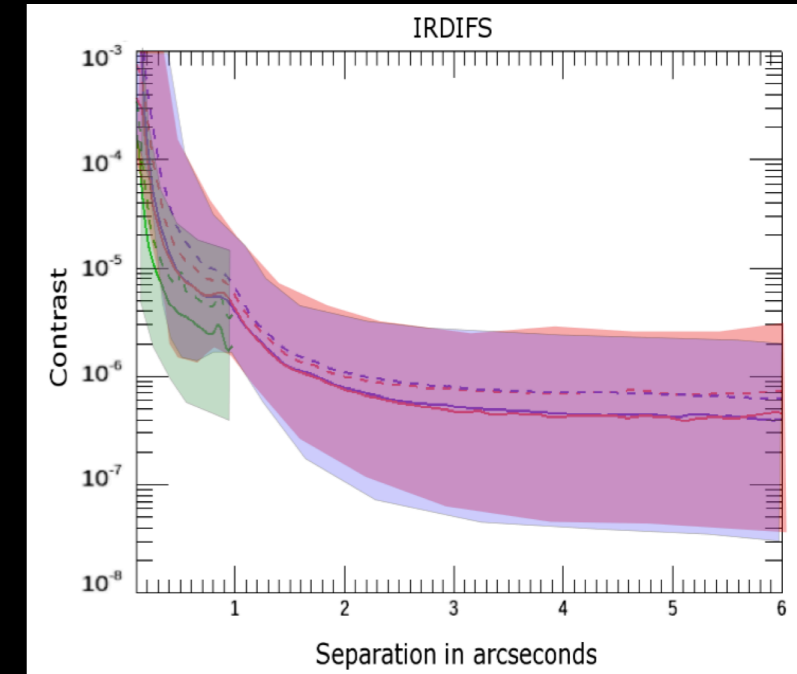
Calcium and Lithium: BAFFLES (<https://github.com/adamstanfordmoore/BAFFLES>, Stanford-Moore et al. 2020)

Contrast Curves

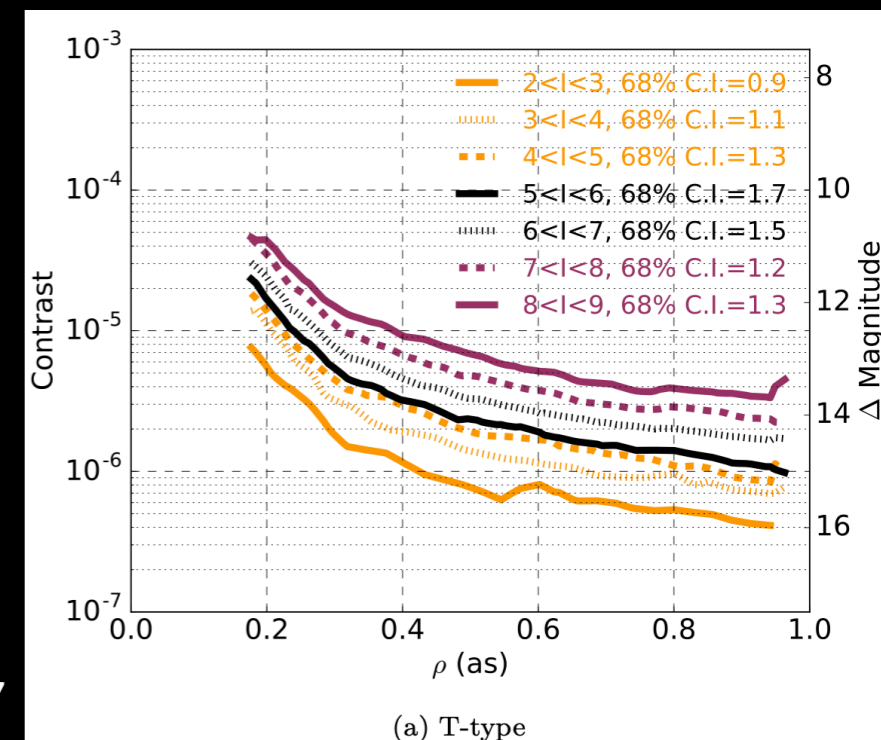
Limiting flux ratio (or magnitude difference) where a companion can be detected

Typically less sensitive closer to the star, more sensitive further out

Depends on: instrument, data reduction, brightness of star, airmass, amount of rotation, weather...



Langlois et al. 2019



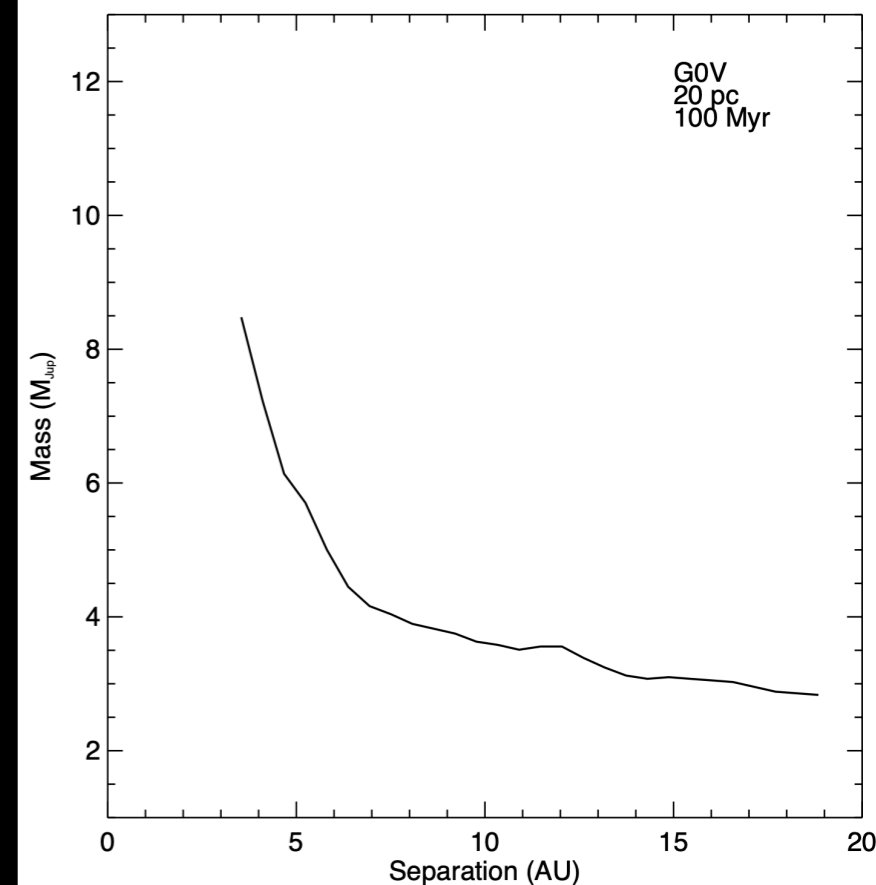
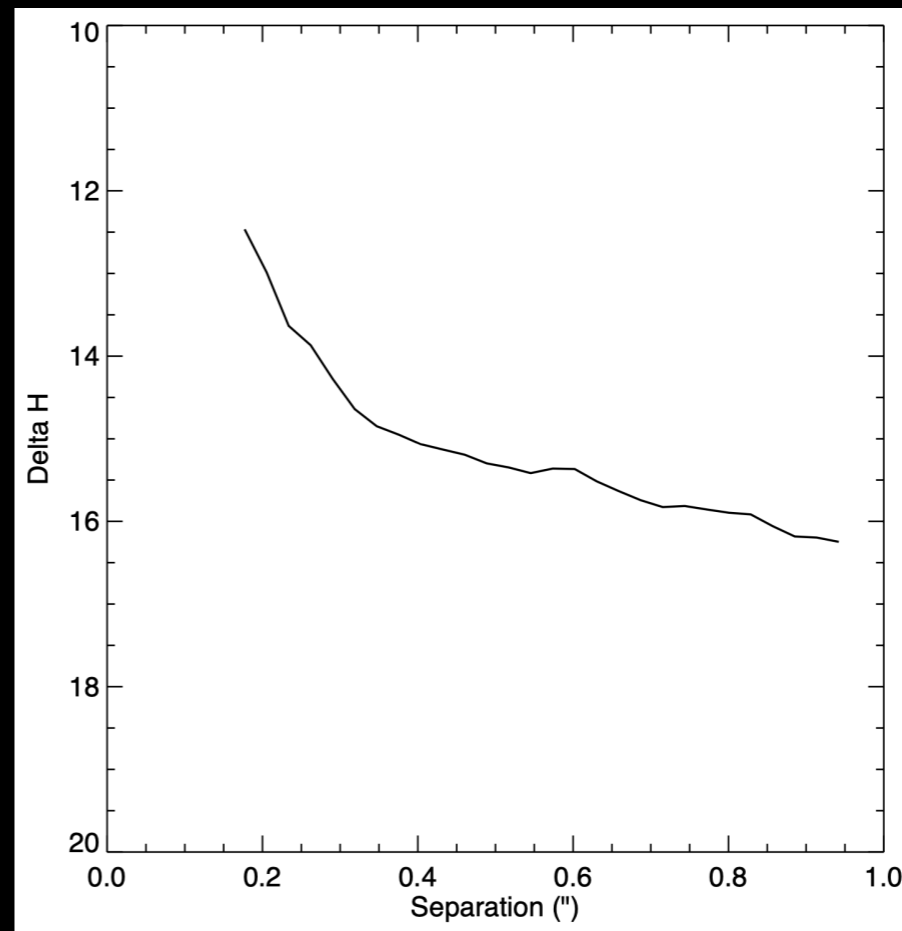
Ruffio et al. 2017

Contrast Curves and Stellar Properties

Contrast curves are delta-magnitude (or flux ratio) vs. projected separation in arcseconds

We use the star's absolute magnitude, the star's age, and evolutionary models (e.g. COND, Sonora, BT-Settl, etc) to convert to planet mass

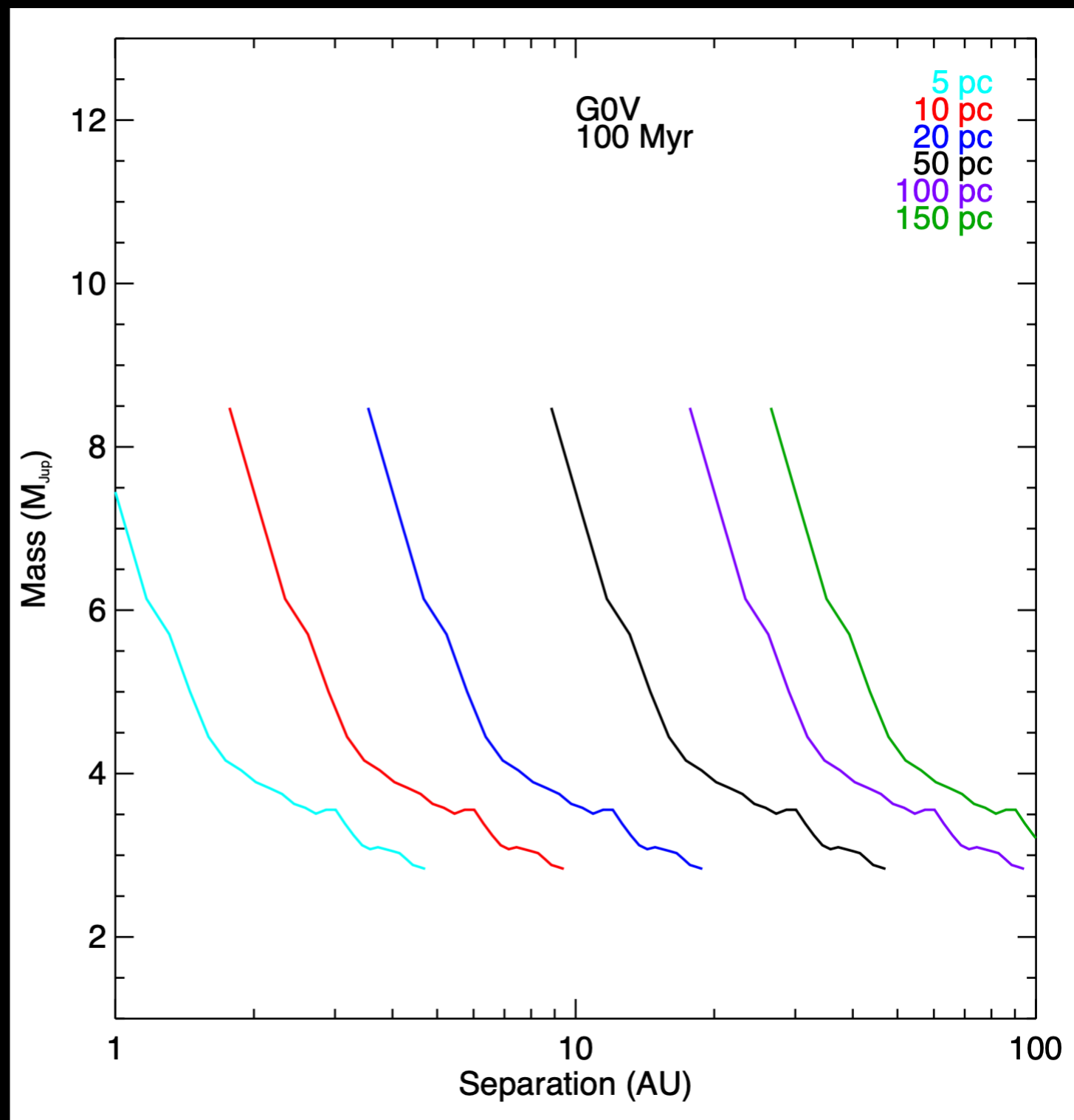
We use the star's distance to convert to separation in AU



Contrast Curves and Distance

The same contrast curve reaches closer physical separations for closer stars

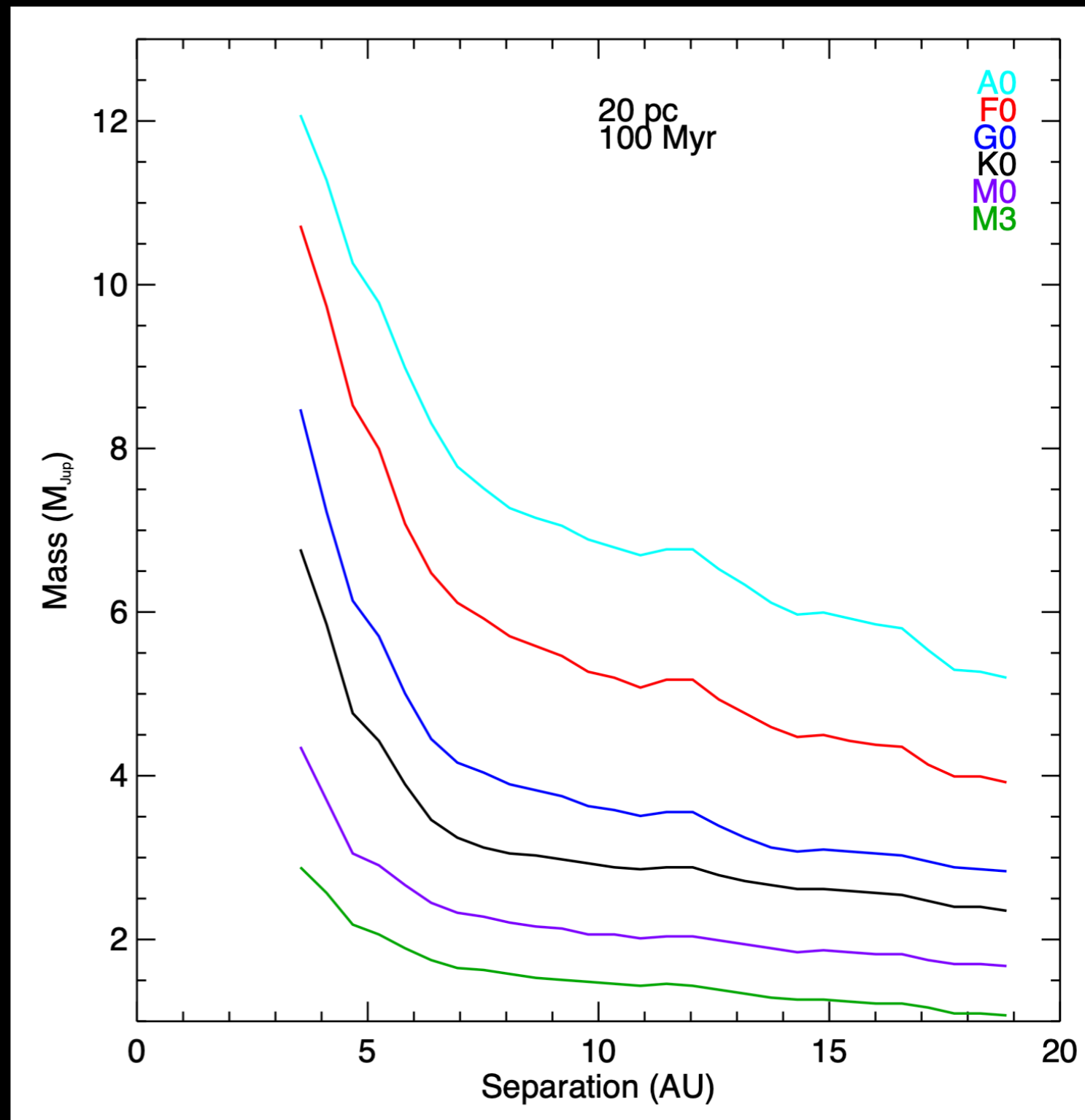
(Another effect: more distant stars have a fainter apparent magnitude, leading to worse AO performance and more significant read noise)



Contrast Curves and Spectral Type

Earlier-type stars are intrinsically brighter

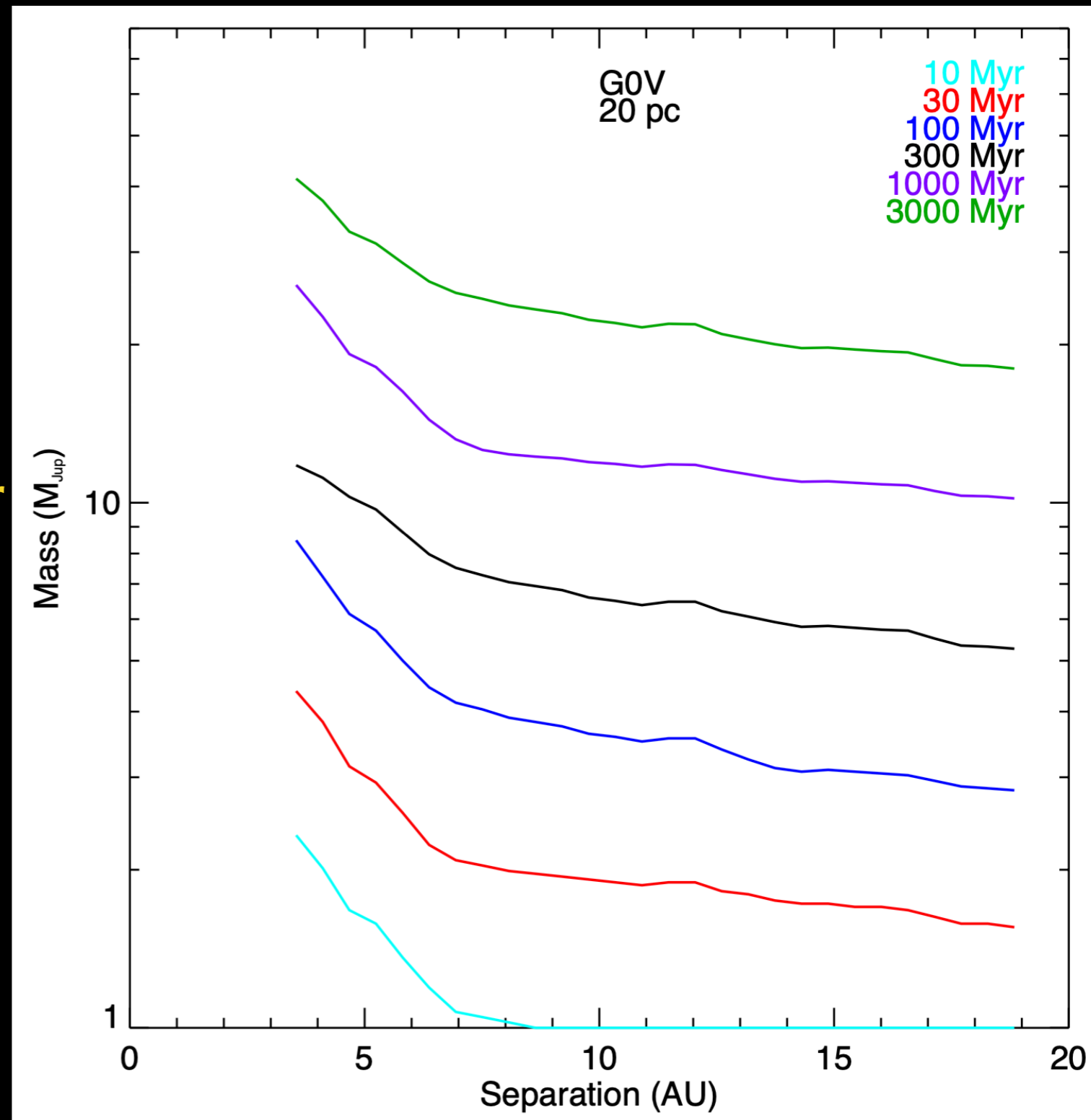
The same contrast curve will reach lower-mass planets for later-type stars



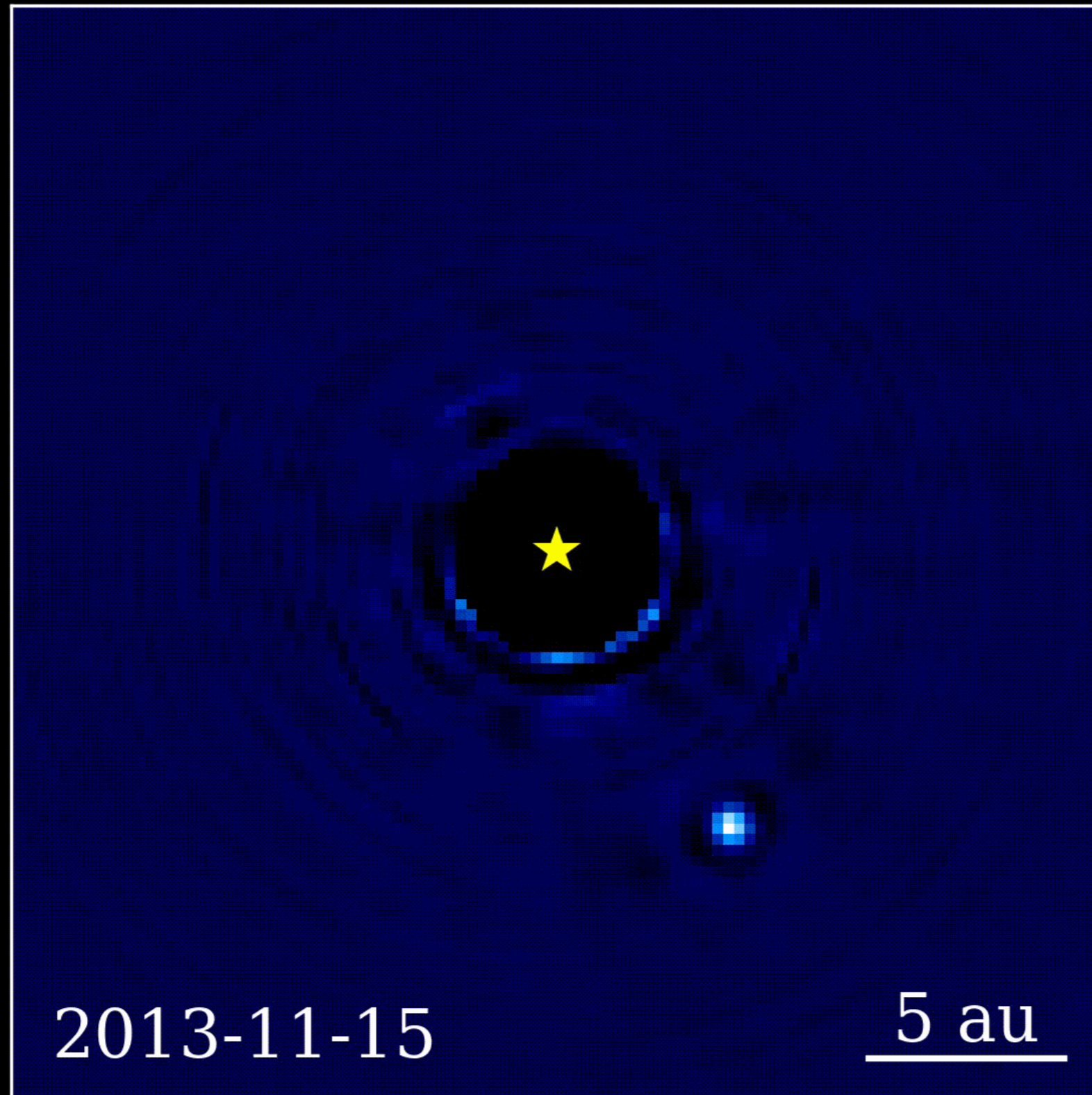
Contrast Curves and Age

Younger planets are brighter and easier to detect

The same contrast curve can detect Jupiter-mass planets around a younger star, and only brown dwarfs around an older star

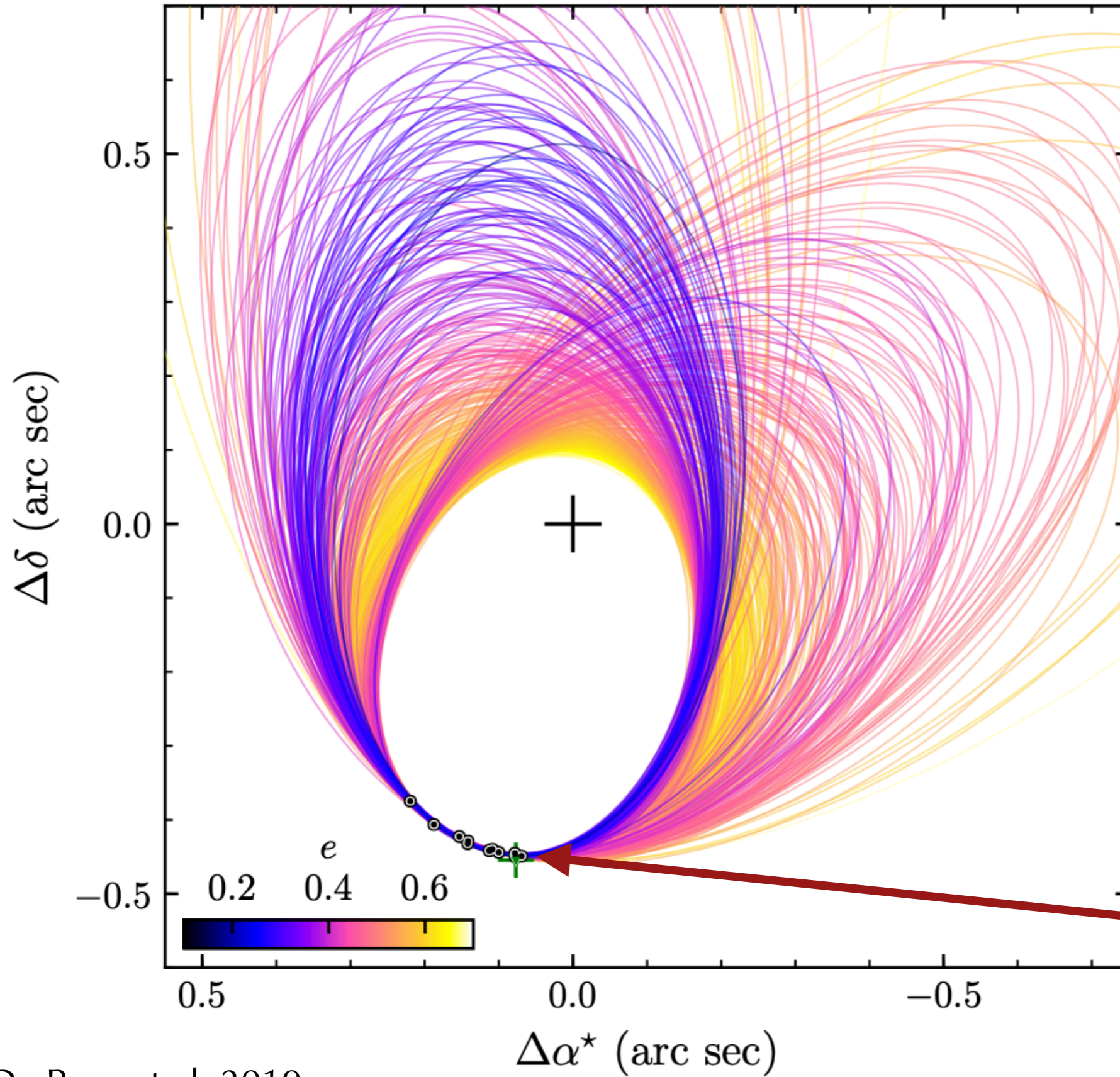


Separation and semi-major axis



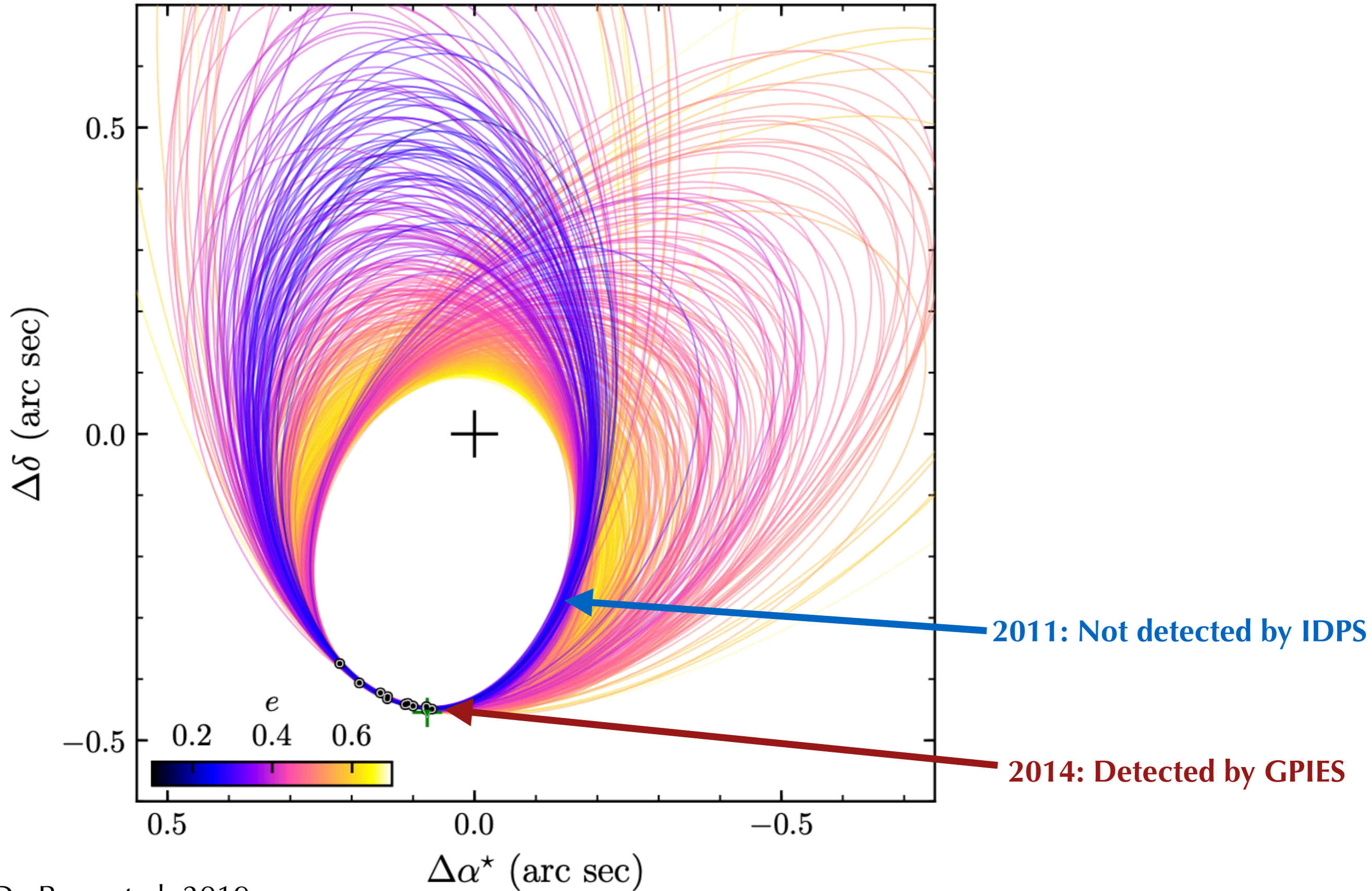
Movie from Jason Wang

51 Eridani b and orbital completeness

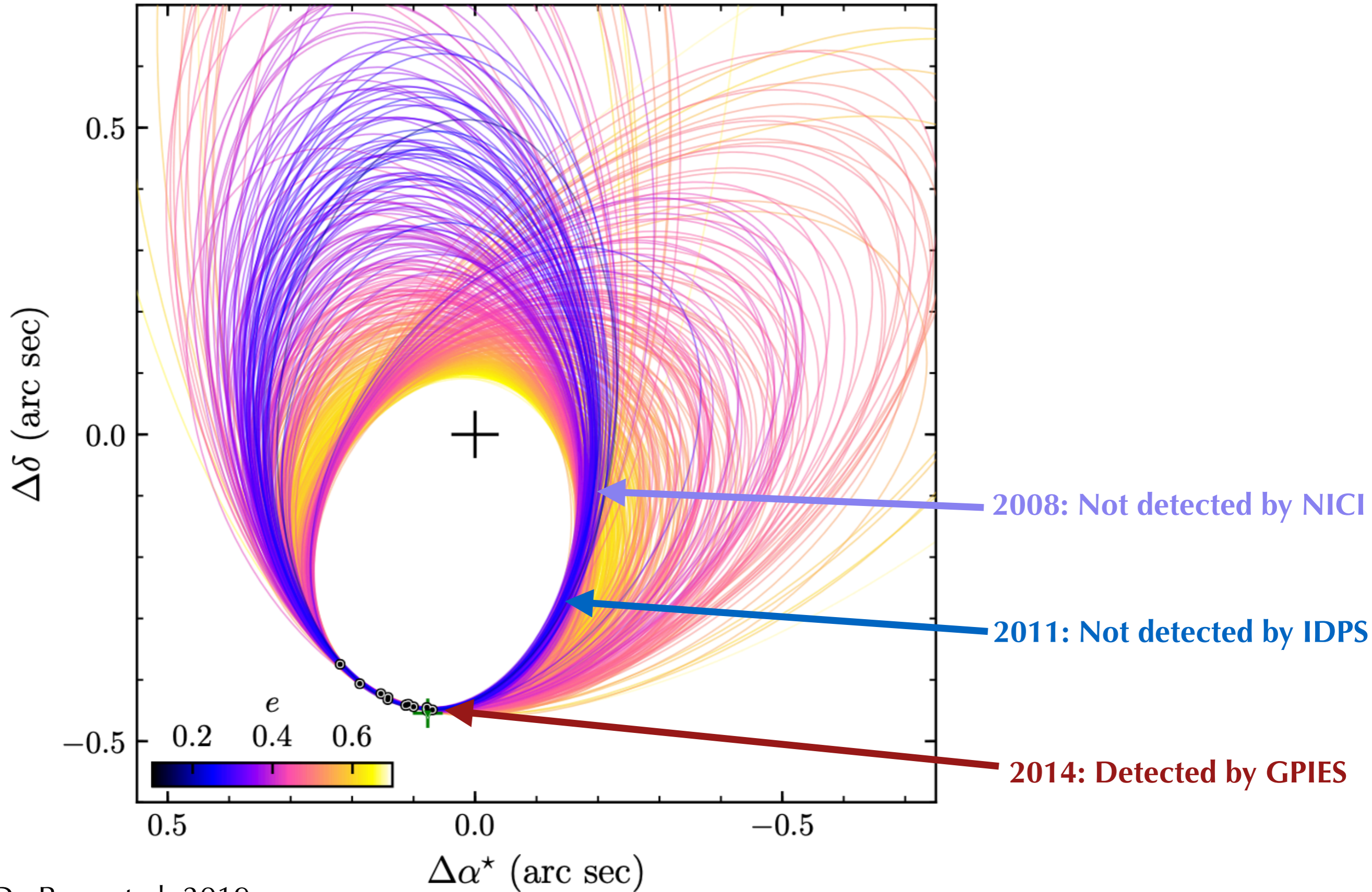


2014: Detected by GPIES

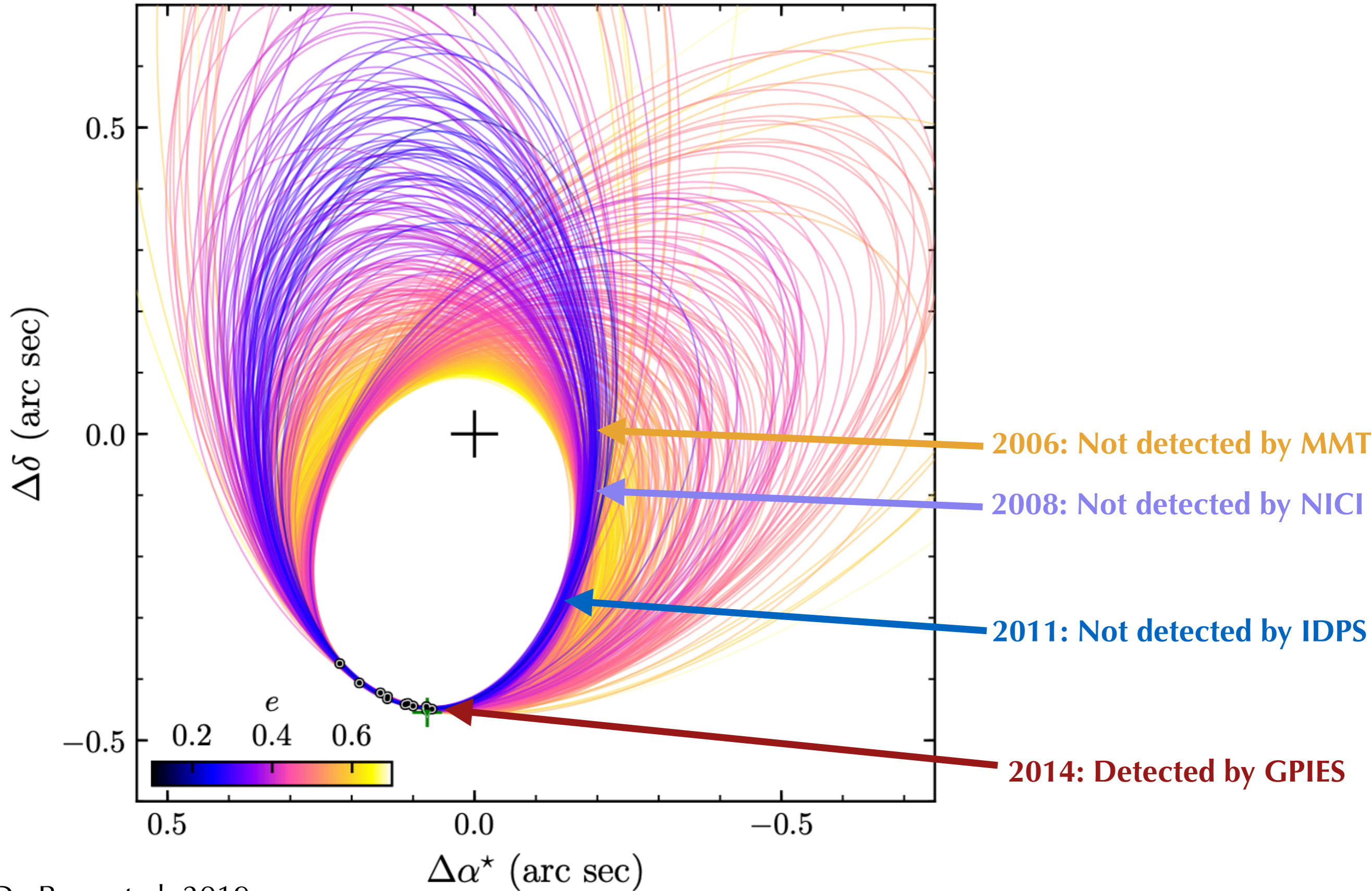
51 Eridani b and orbital completeness



51 Eridani b and orbital completeness



51 Eridani b and orbital completeness

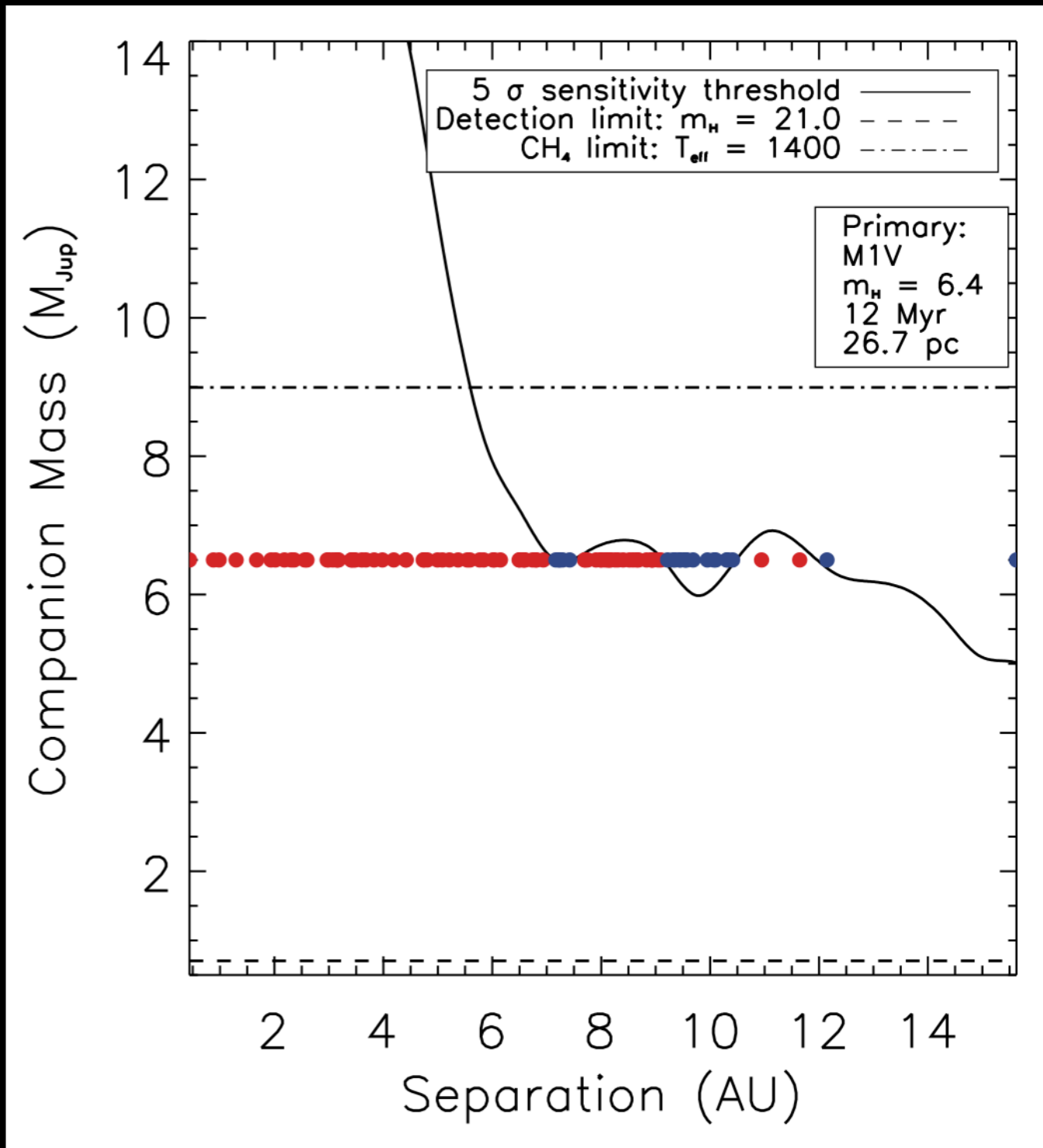


Orbital properties and completeness

Some planets may be missed while at an unfortunate orbital phase

Monte Carlo simulations (e.g. Nielsen et al. 2008, MESS: Bonavita et al. 2013) marginalize over orbital elements and phase

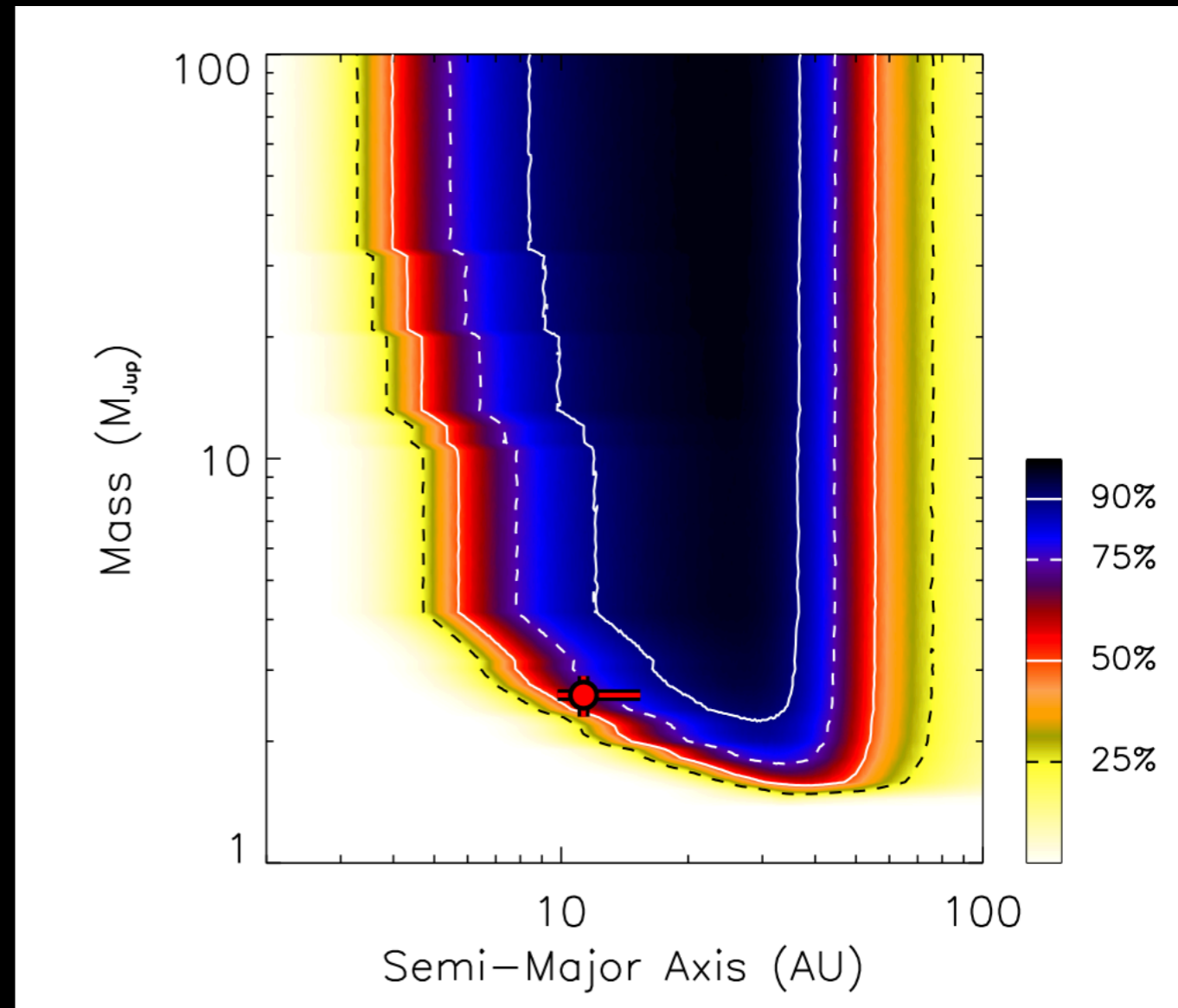
Completeness is the fraction of injected planets that lie above the contrast curve



Completeness for a single star

Completeness maps:
fraction of planets at a
given mass and semi-major
axis that could be detected

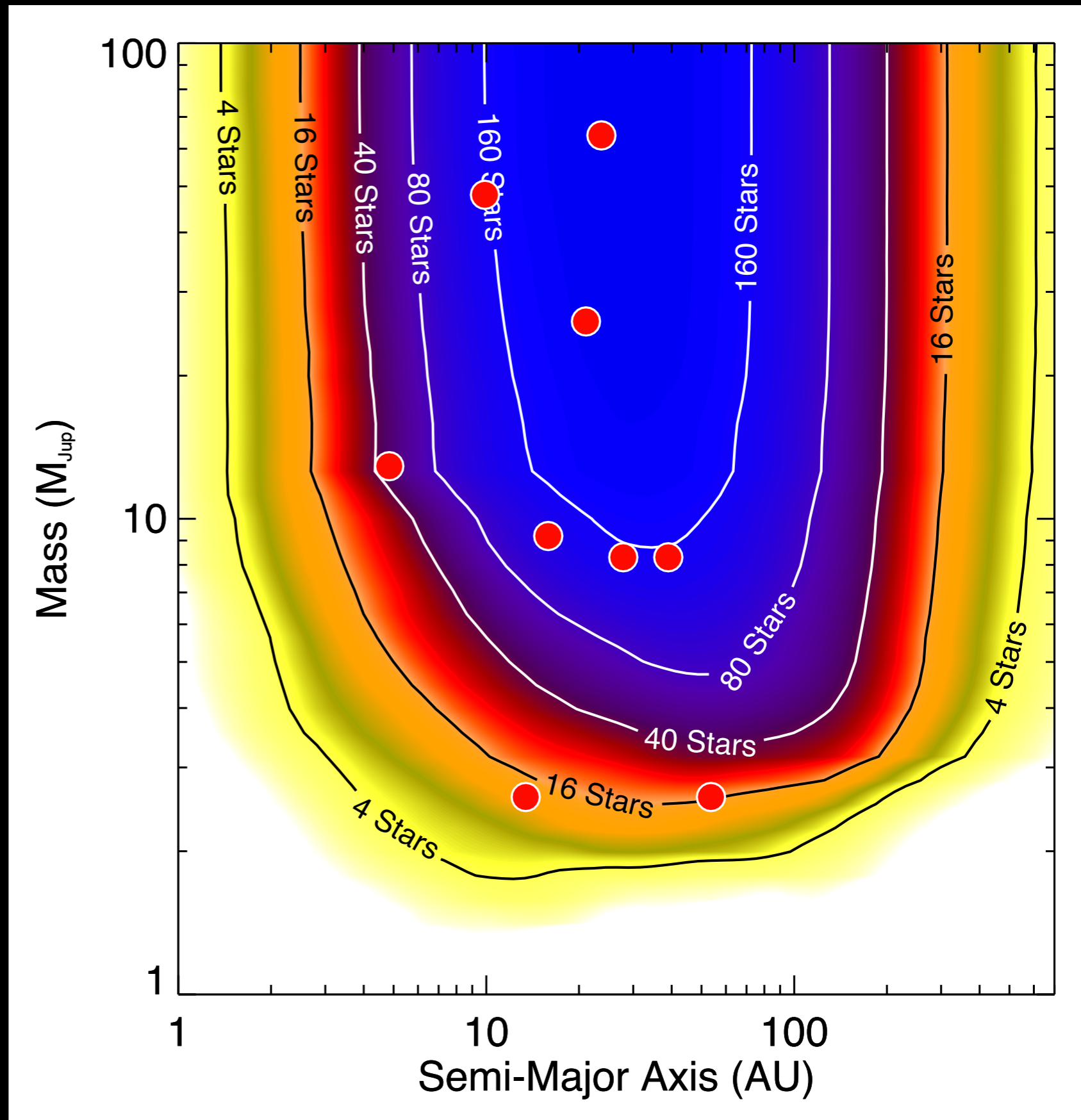
Can be generated for a
single observation, or
multiple observations at
different epochs with
different instruments
(accounting for orbital
motion)



Depth of Search (Tongue Plots)

Completeness maps for all stars in a survey summed together

At a given location: the number of stars in the survey where a planet of that mass and semi-major axis could be detected



Demographics model fitting (one method)

Parameterized model for planet occurrence:

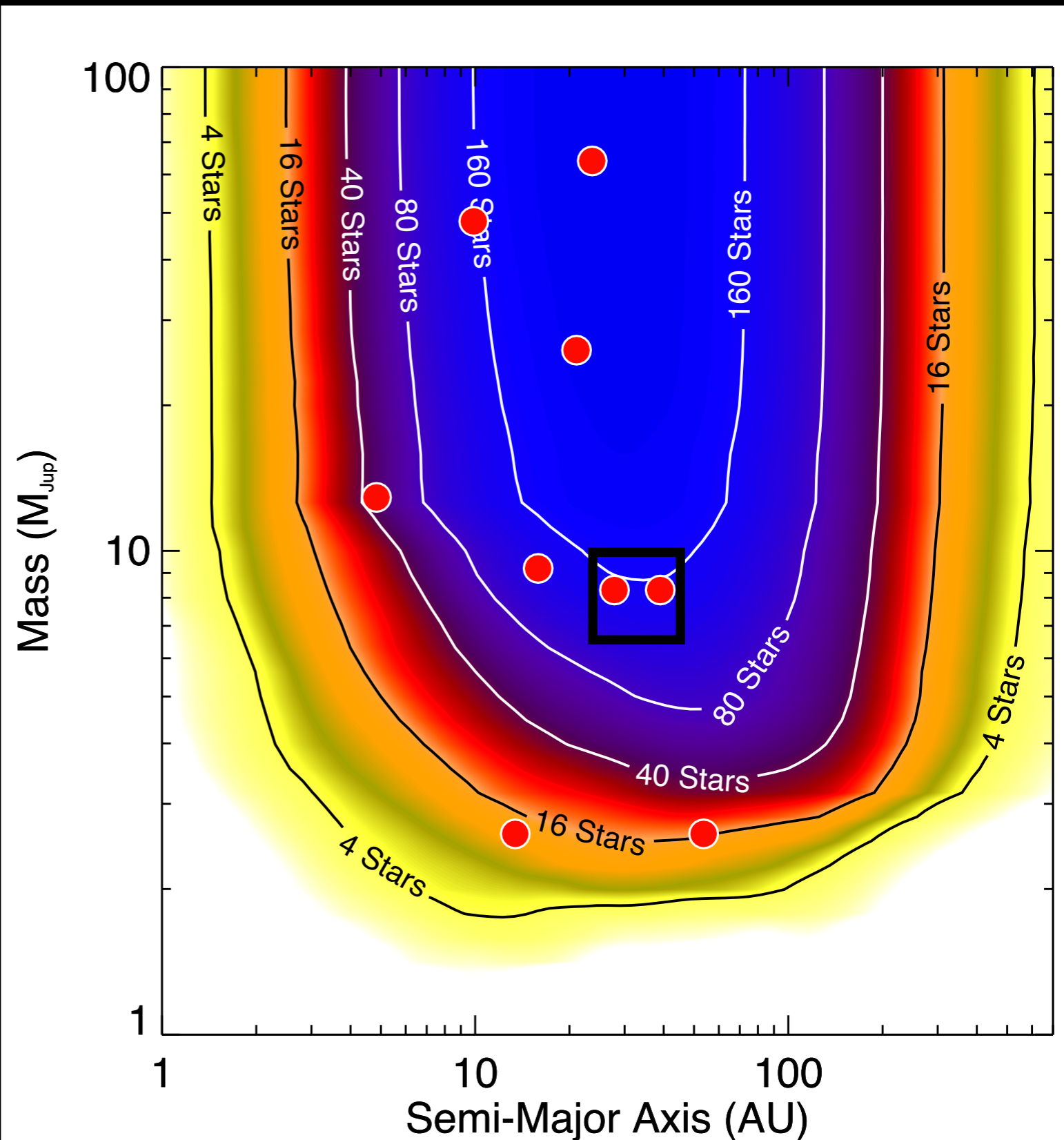
$$\frac{d^2N}{dm da} \propto f m^\alpha a^\beta$$

Poisson likelihood:

$$p(f, \alpha, \beta) = \frac{E^M e^{-E}}{M!}$$

Measured (M): Number of planets in a bin

Expected (E): Expected number of planets in that bin



Likelihood (one method)

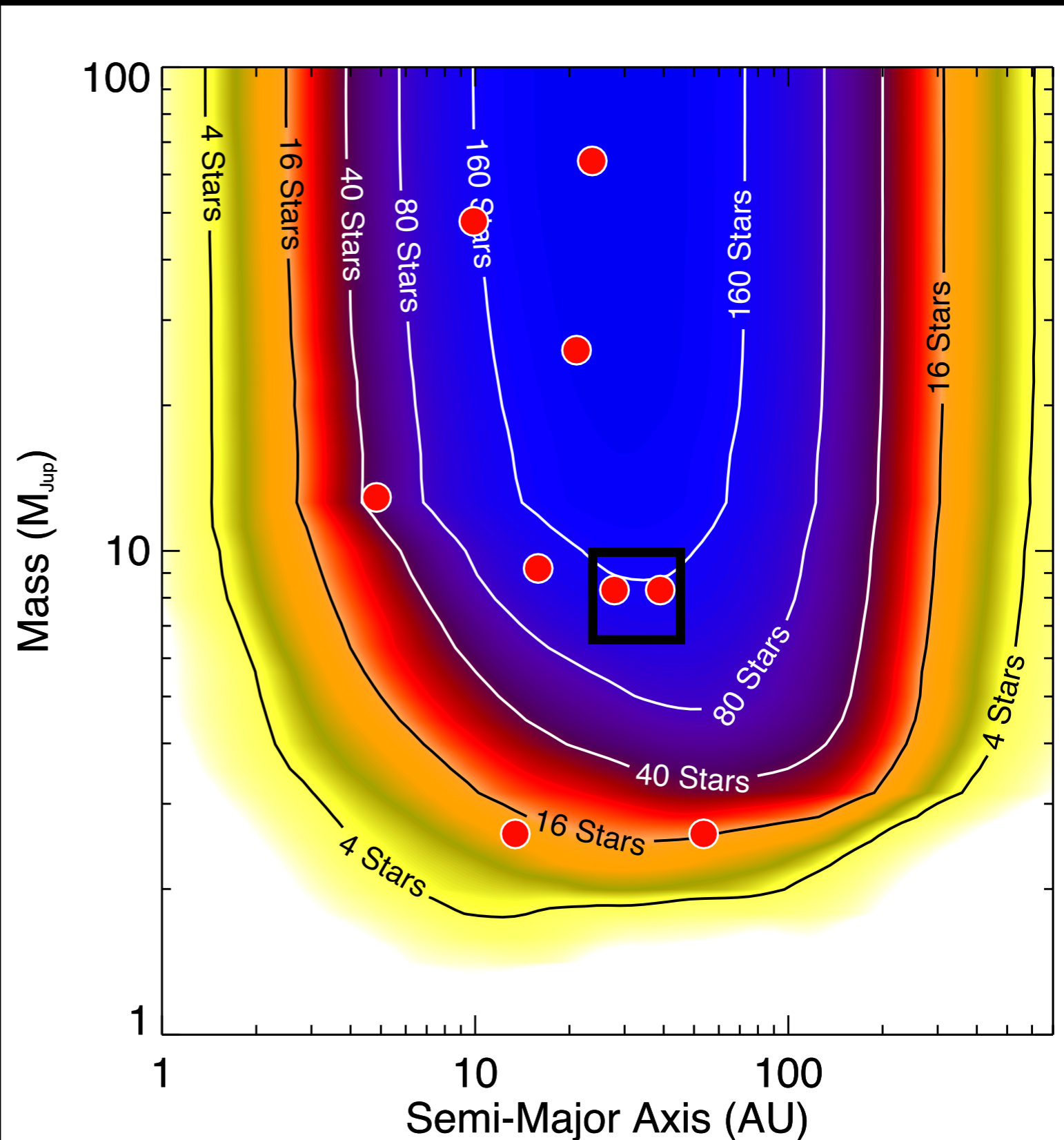
Poisson likelihood:

$$p(f, \alpha, \beta) = \frac{E^M e^{-E}}{M!}$$

$$E = N_* \iint C(m, a) \frac{d^2 N}{dm da} dm da$$

$C(m, a)$: fractional completeness

N_* : Number of stars in the survey



The Gemini Planet Imager Exoplanet Survey (GPIES)



Exoplanet Survey

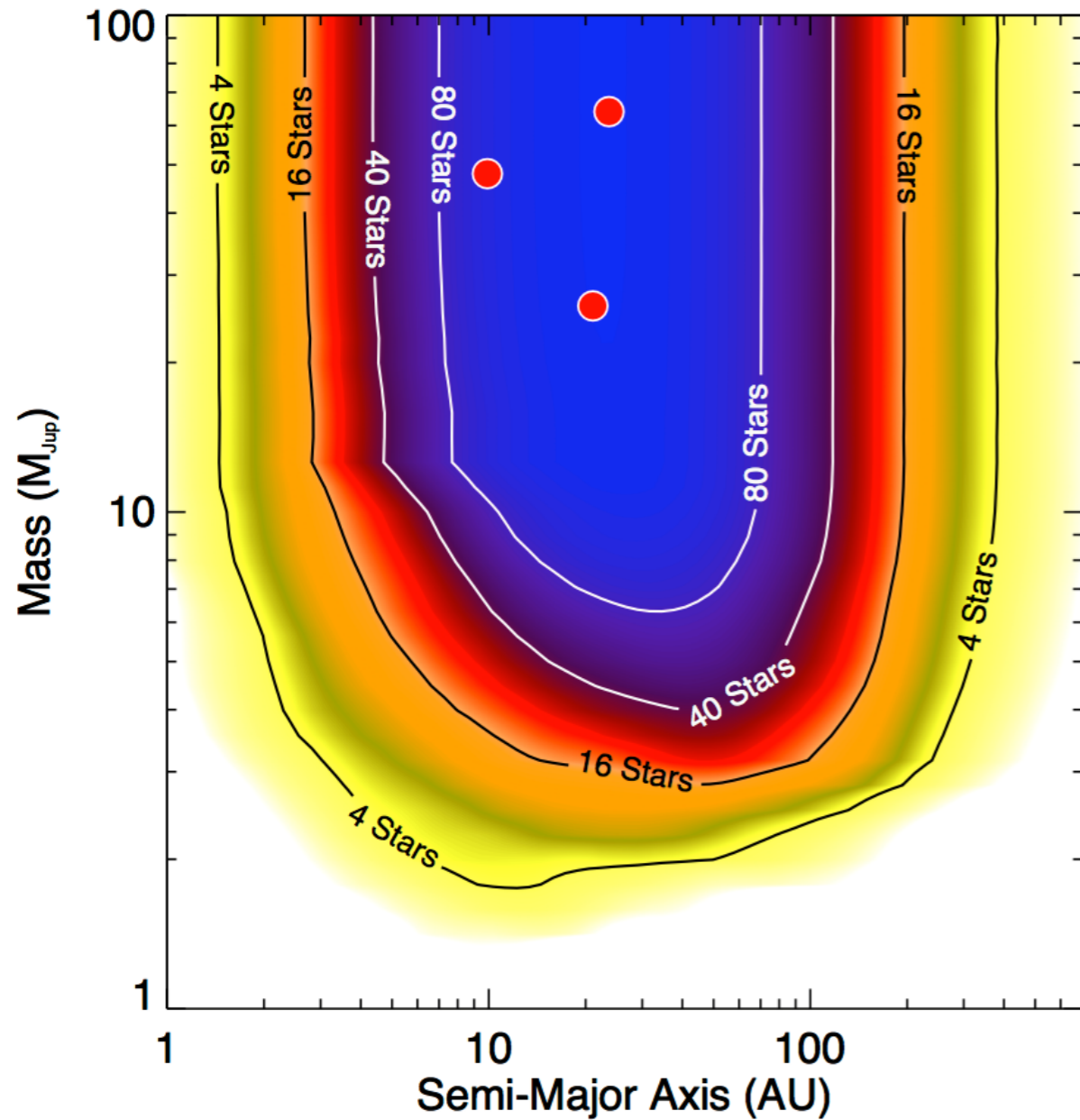
The GPI team (a subset)



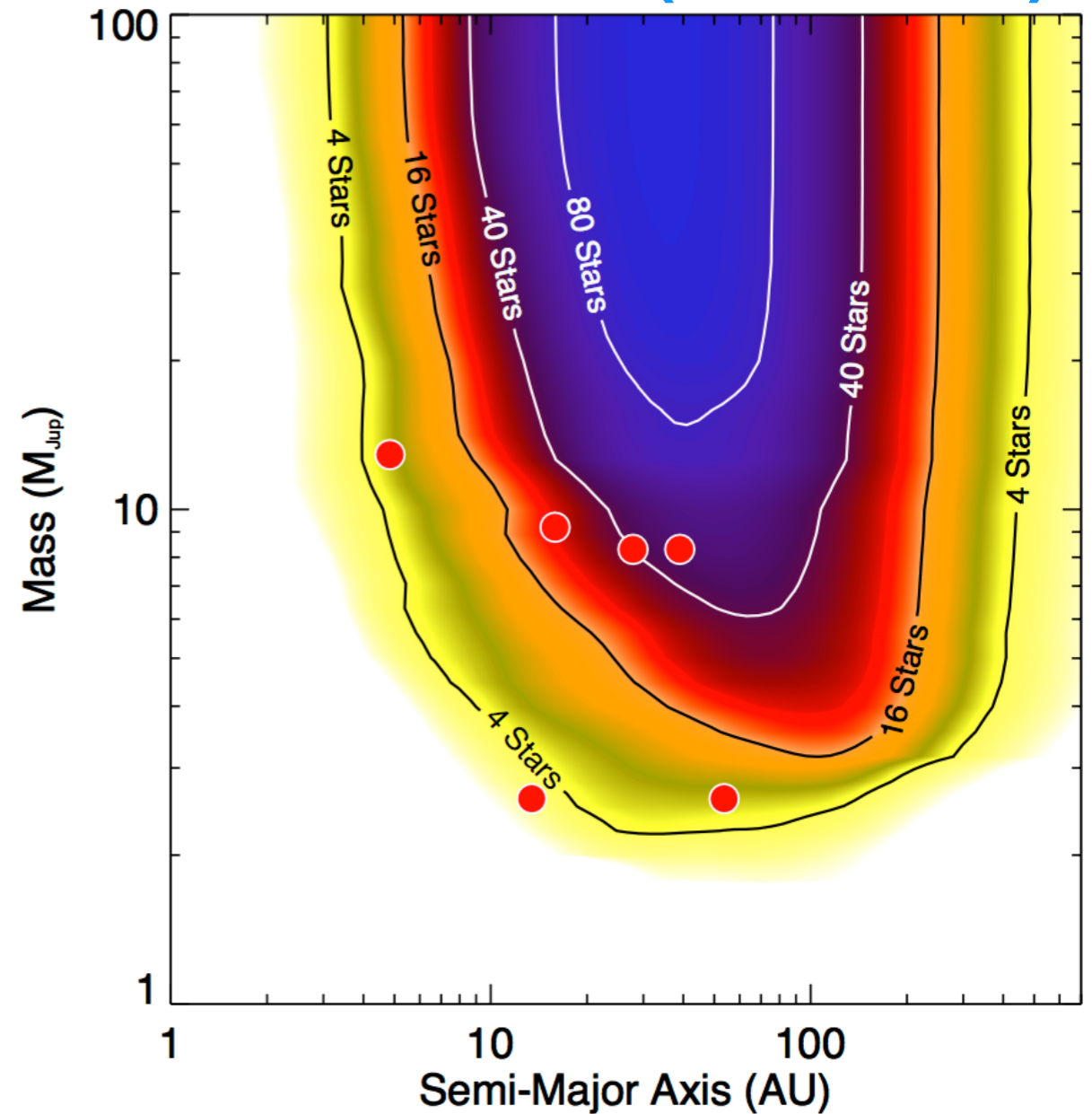
Jonathan Aguilar, S. Mark Ammons, Pauline Arriaga, Etienne Artigau, Vanessa Bailey, Travis Barman, Steve Beckwith, Sebastian Bruzzone, Joanna Bulger, Ben Burningham, Adam S. Burrows, Eric Cady, Christine Chen, Eugene Chiang, Jeffrey K. Chilcote, Rebekah I. Dawson, Robert J. De Rosa, Ruobing Dong, René Doyon, Zachary H. Draper, Gaspard Duchêne, Thomas M. Esposito, Daniel Fabrycky, Michael P. Fitzgerald, Katherine B. Follette, Jonathan J. Fortney, BJ Fulton, Benjamin Gerard, James R. Graham, Alexandra Z. Greenbaum, Pascale Hibon, Sasha Hinkley, Lea Hirsch, Justin Hom, Andrew Howard, Tara Hufford, Li-Wei Hung, Patrick Ingraham, Rebecca Jensen-Clem, Mara Johnson-Groh, Paul Kalas, Quinn Konopacky, David Lafreniere, James E. Larkin, Samantha Lawler, Eve Lee, Jinhee Lee, Michael Line, Bruce Macintosh, Jerome Maire, Franck Marchis, Mark S. Marley, Christian Marois, Brenda C. Matthews, Stanimir Metchev, Max Millar-Blanchaer, Caroline V. Morley, Katie M. Morzinski, Ruth Murray-Clay, Eric L. Nielsen, Andrew Norton, Rebecca Oppenheimer, David W. Palmer, Rahul Patel, Jenny Patience, Marshall D. Perrin, Charles Poteet, Lisa A. Poyneer, Laurent Pueyo, Roman R. Rafikov, Abhijith Rajan, Julien Rameau, Fredrik T. Rantakyö, Emily Rice, Malena Rice, Patricio Rojo, Jean-Baptiste Ruffio, M. T. Ruiz, Dominic Ryan, Maissa Salama, Didier Saumon, Dmitry Savransky, Adam C. Schneider, Jacob Shapiro, Anand Sivaramakrishnan, Inseok Song, Rémi Soummer, Sandrine Thomas, Gautam Vasisht, David Vega, J. Kent Wallace, Jason J. Wang, Kimberly Ward-Duong, Sloane J. Wiktorowicz, Schuyler G. Wolff, Joe Zalesky, Ben Zuckerman

A stellar mass/giant planet occurrence correlation

$<1.5 M_{\odot}$ (177 stars)

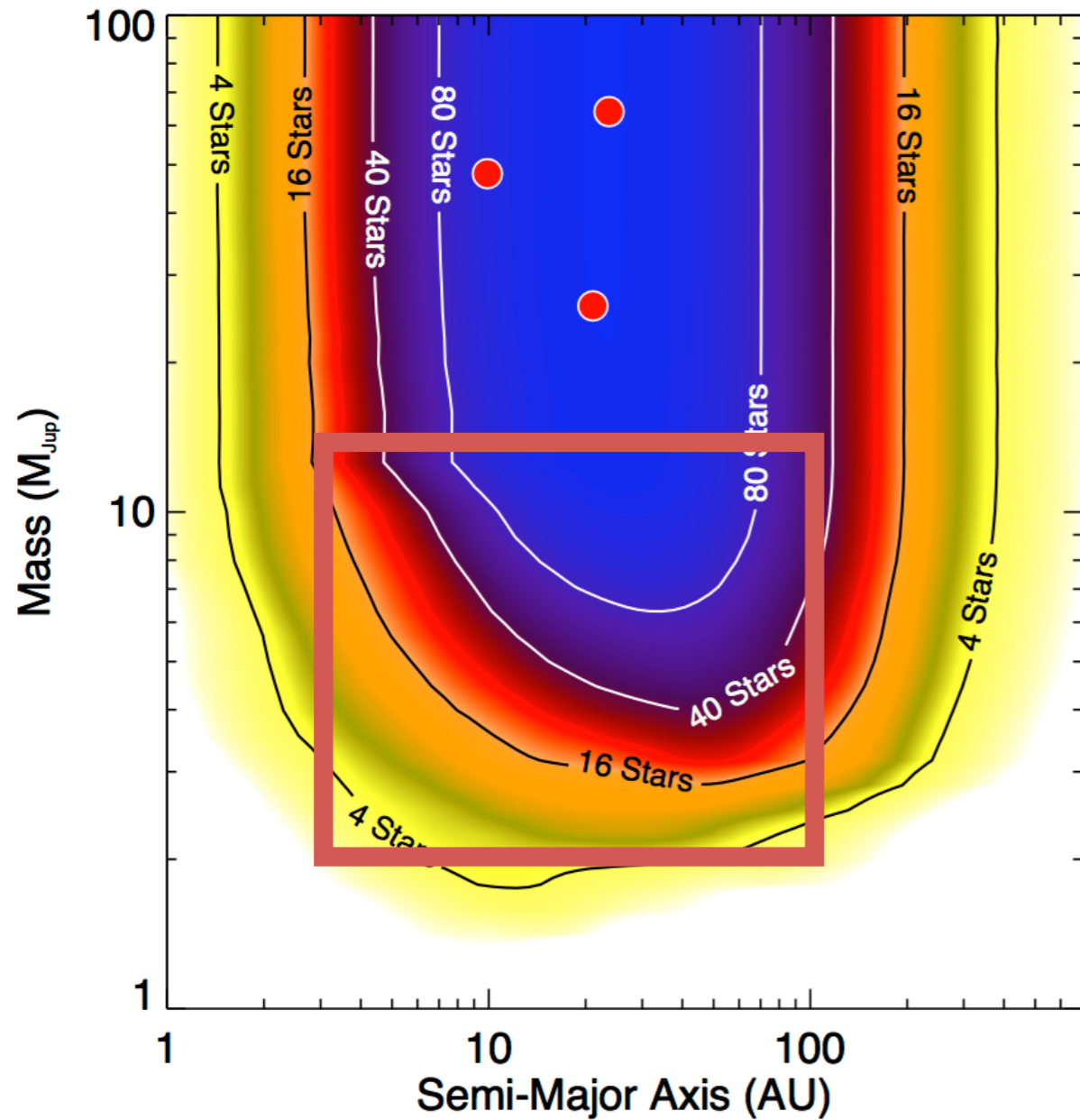


$>1.5 M_{\odot}$ (123 stars)

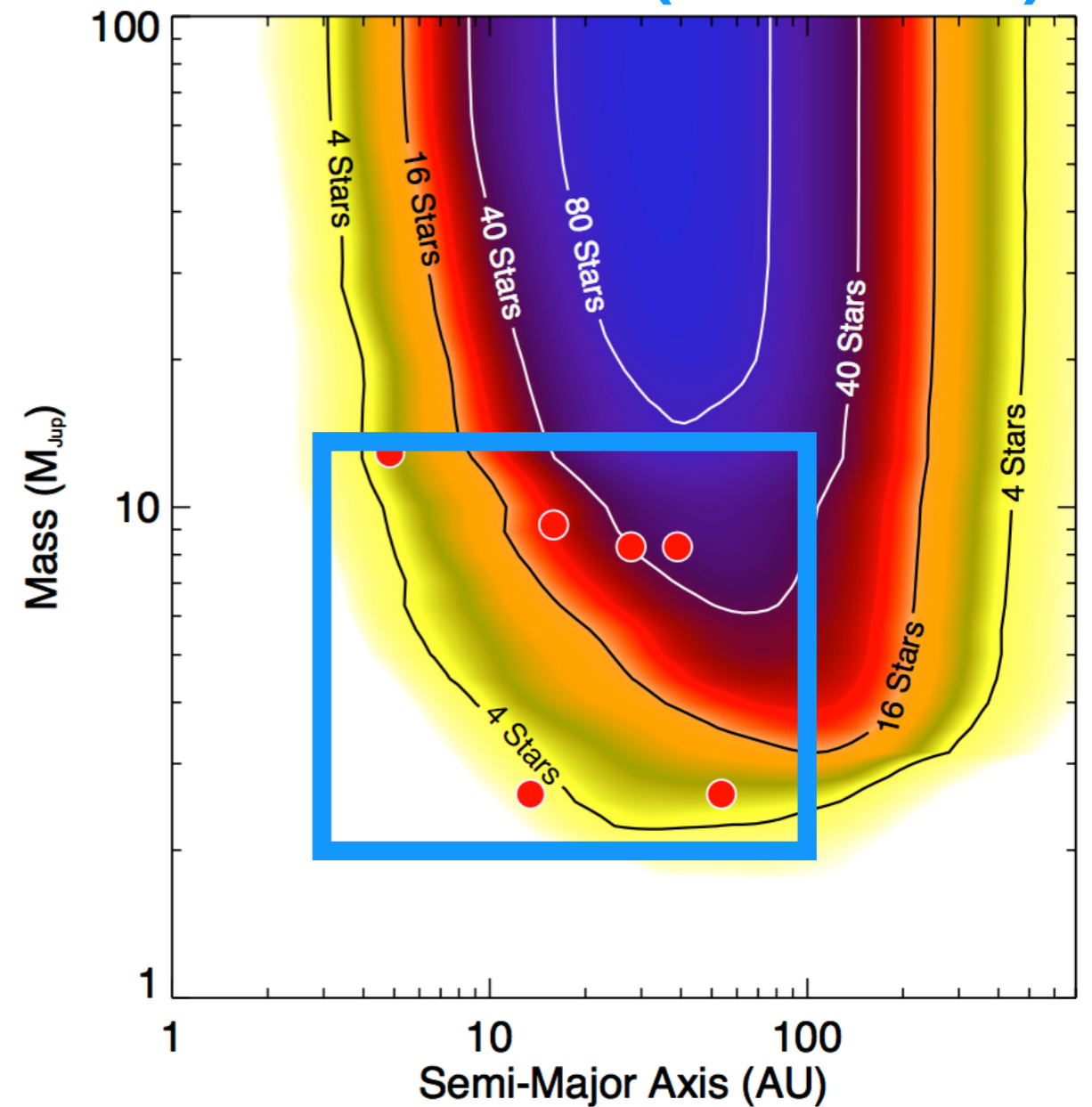


A stellar mass/giant planet occurrence correlation

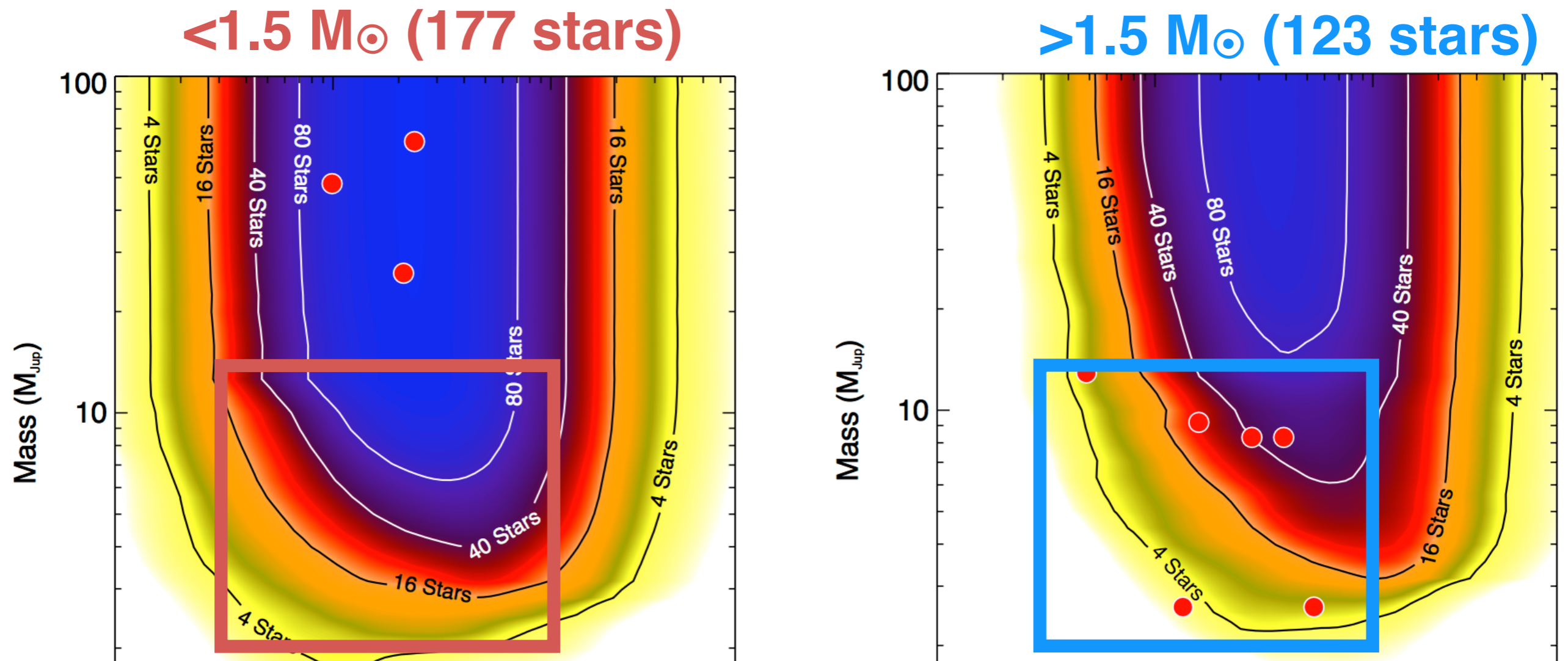
$<1.5 M_{\odot}$ (177 stars)



$>1.5 M_{\odot}$ (123 stars)

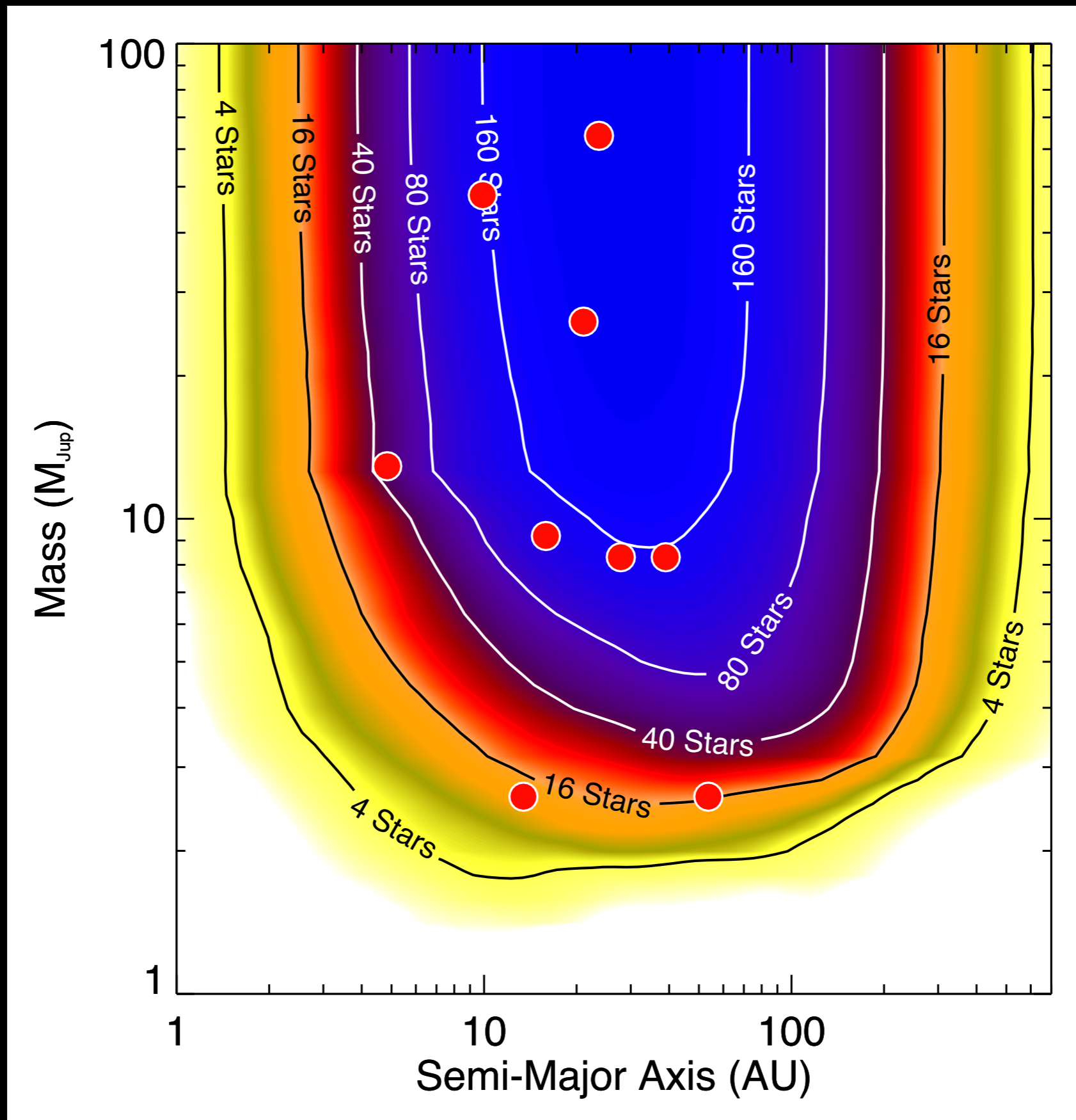


A stellar mass/giant planet occurrence correlation

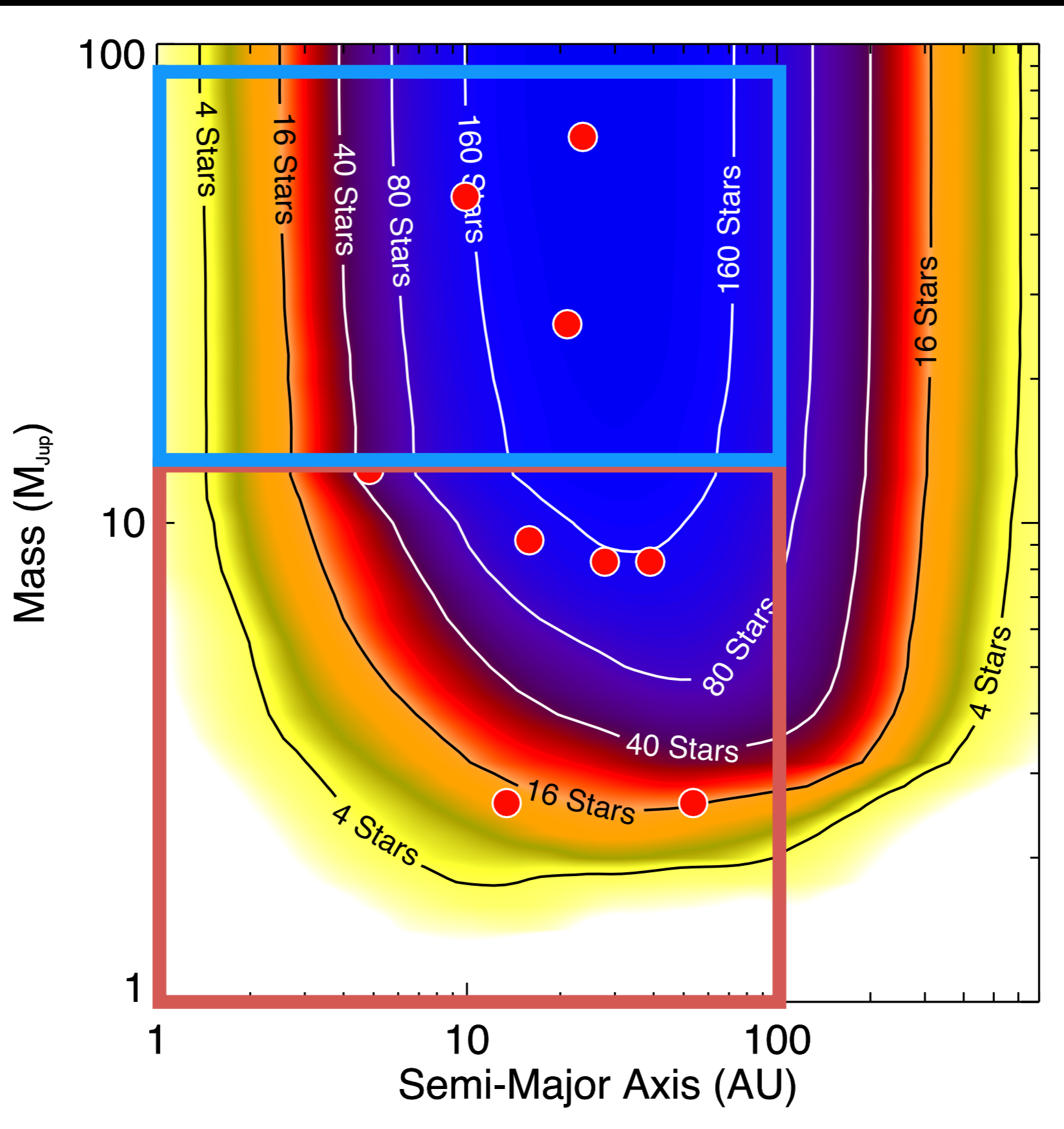


Conclusion 1: wide-separation giant planets are more common around higher-mass stars

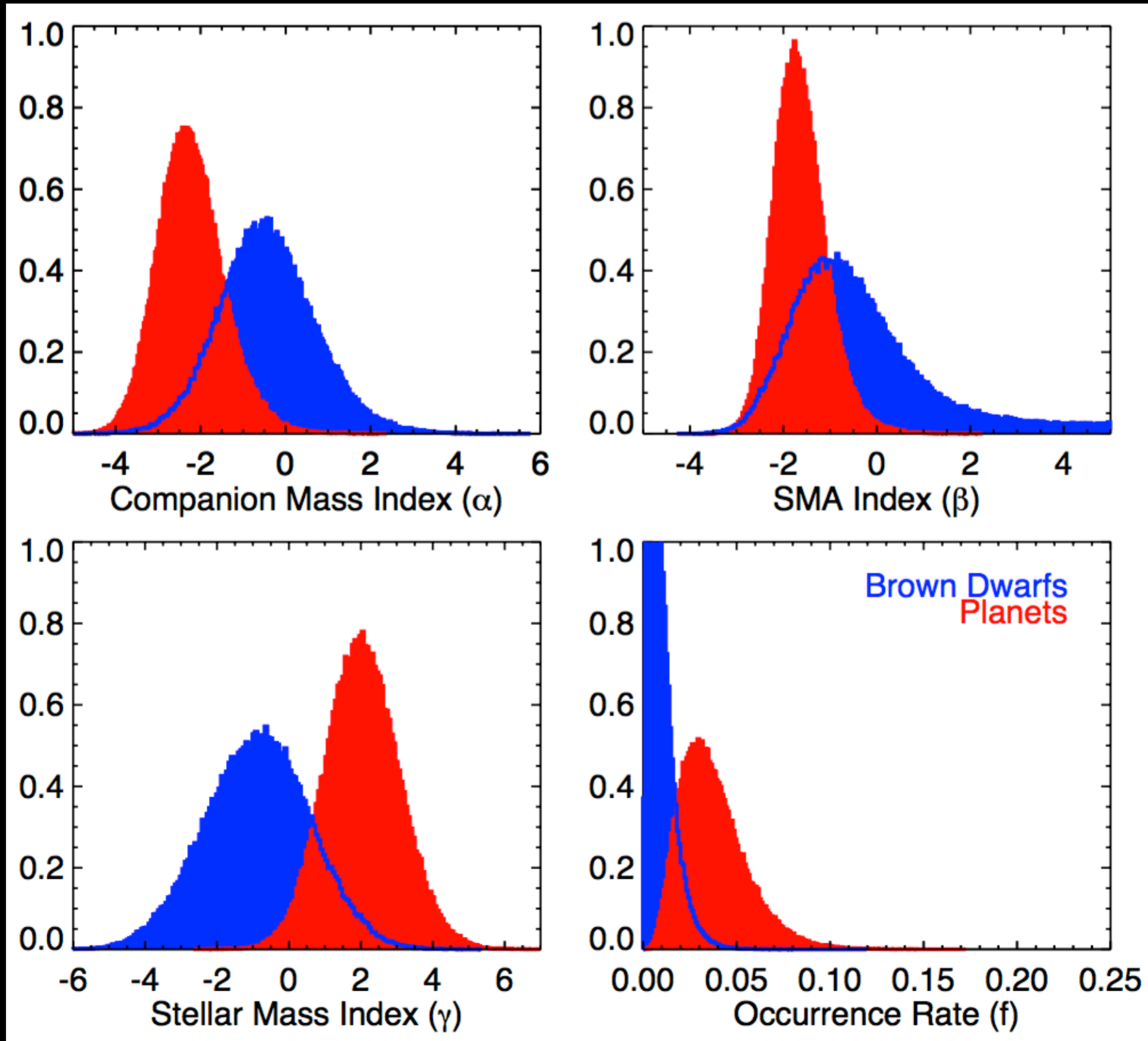
Planets and brown dwarfs



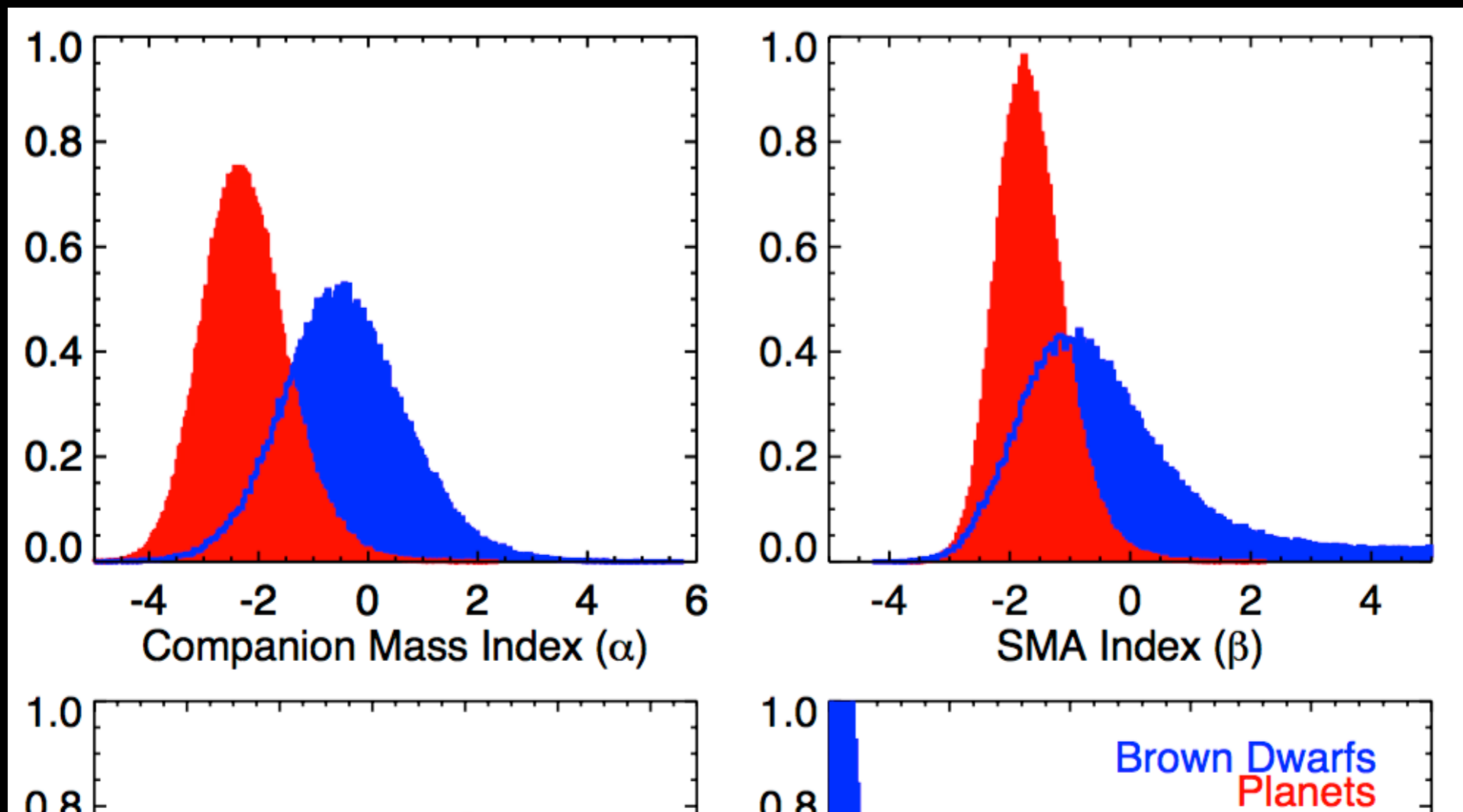
Planets and brown dwarfs



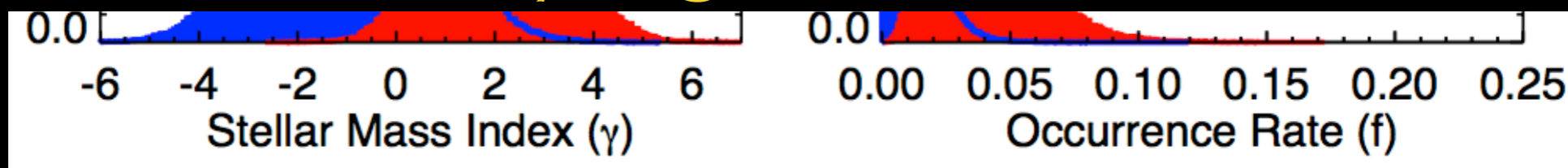
Planets and brown dwarfs



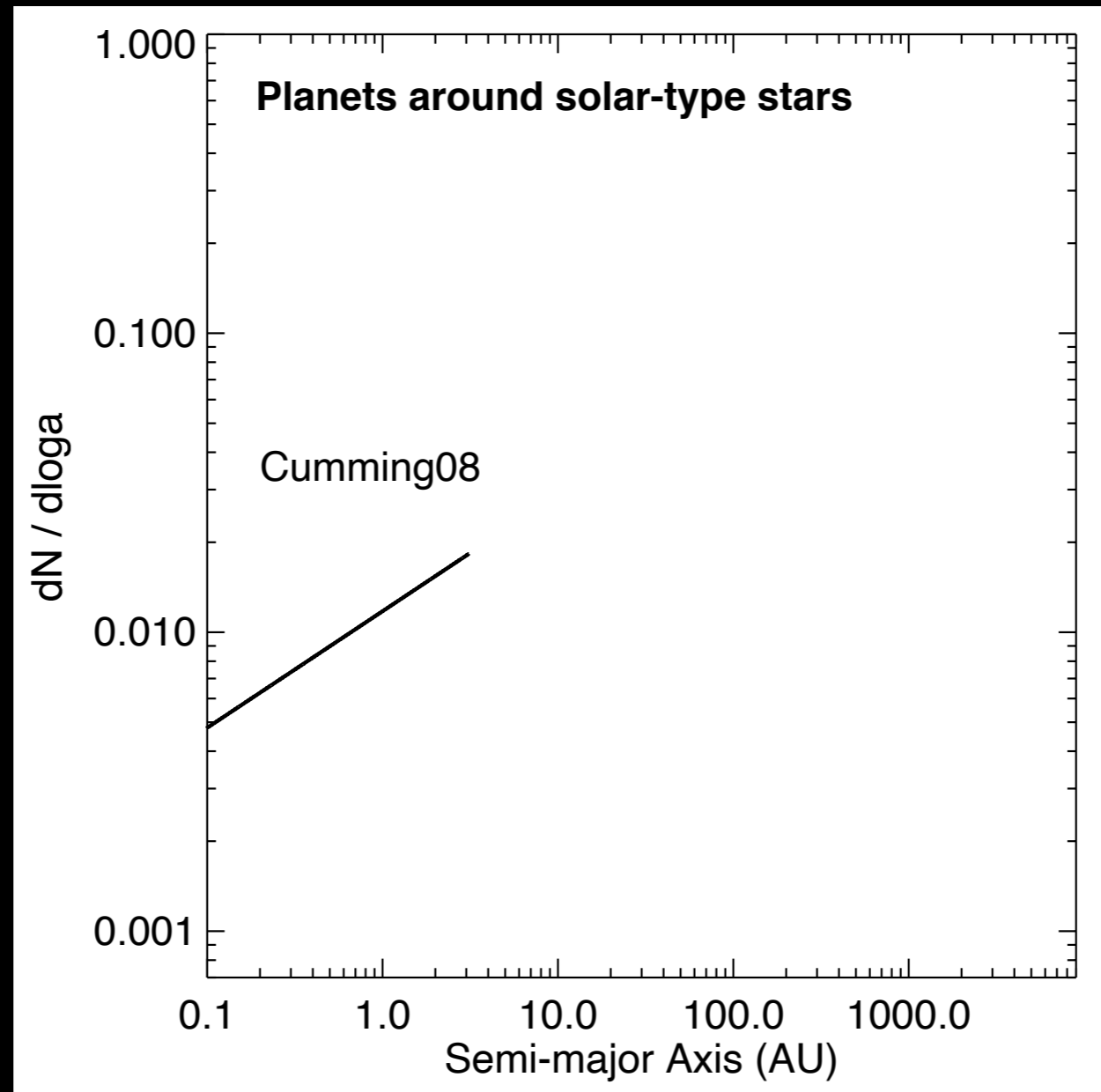
Planets and brown dwarfs



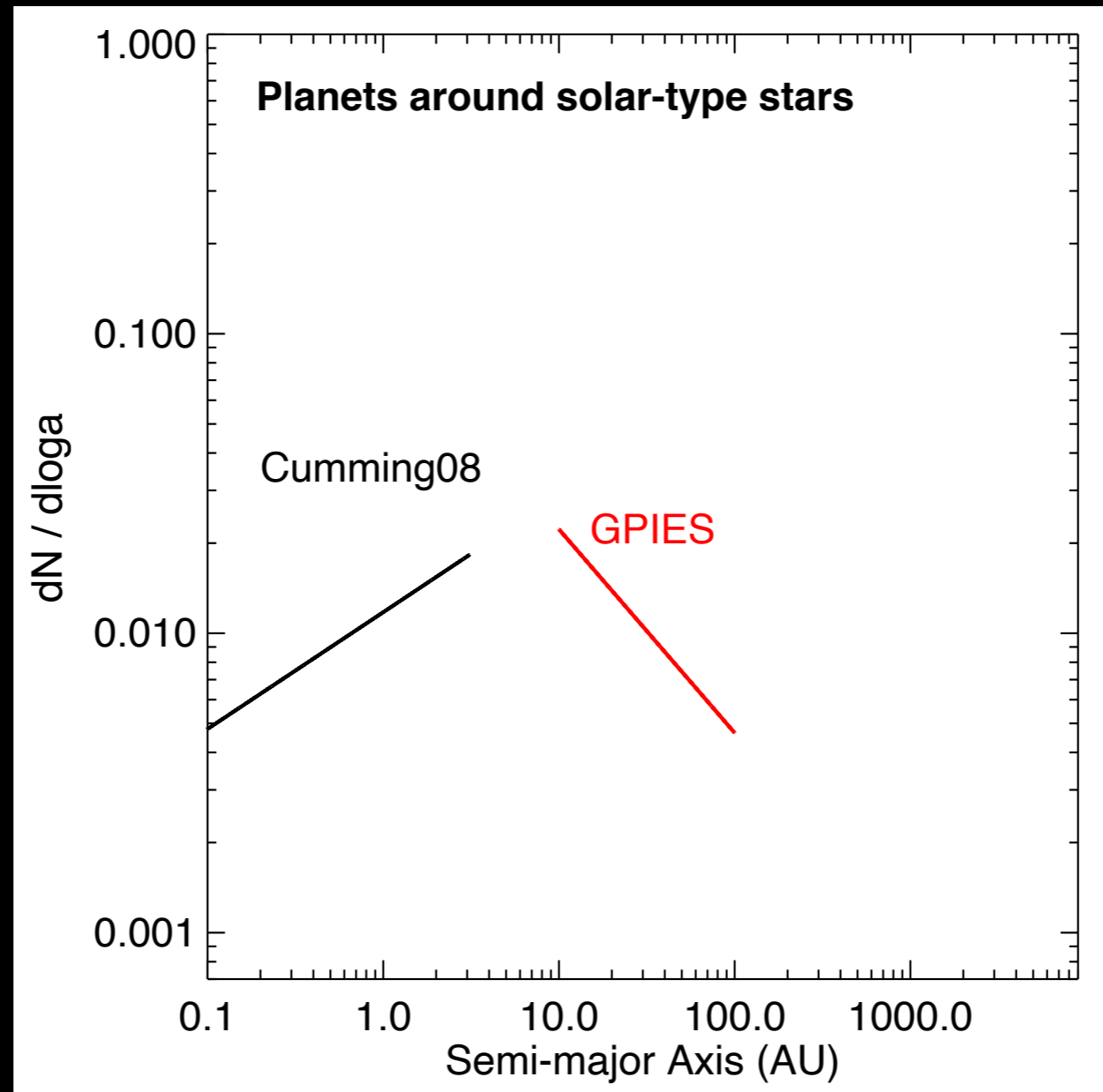
Conclusion 2: at wide separations, giant planets and brown dwarfs seem to follow different underlying distributions



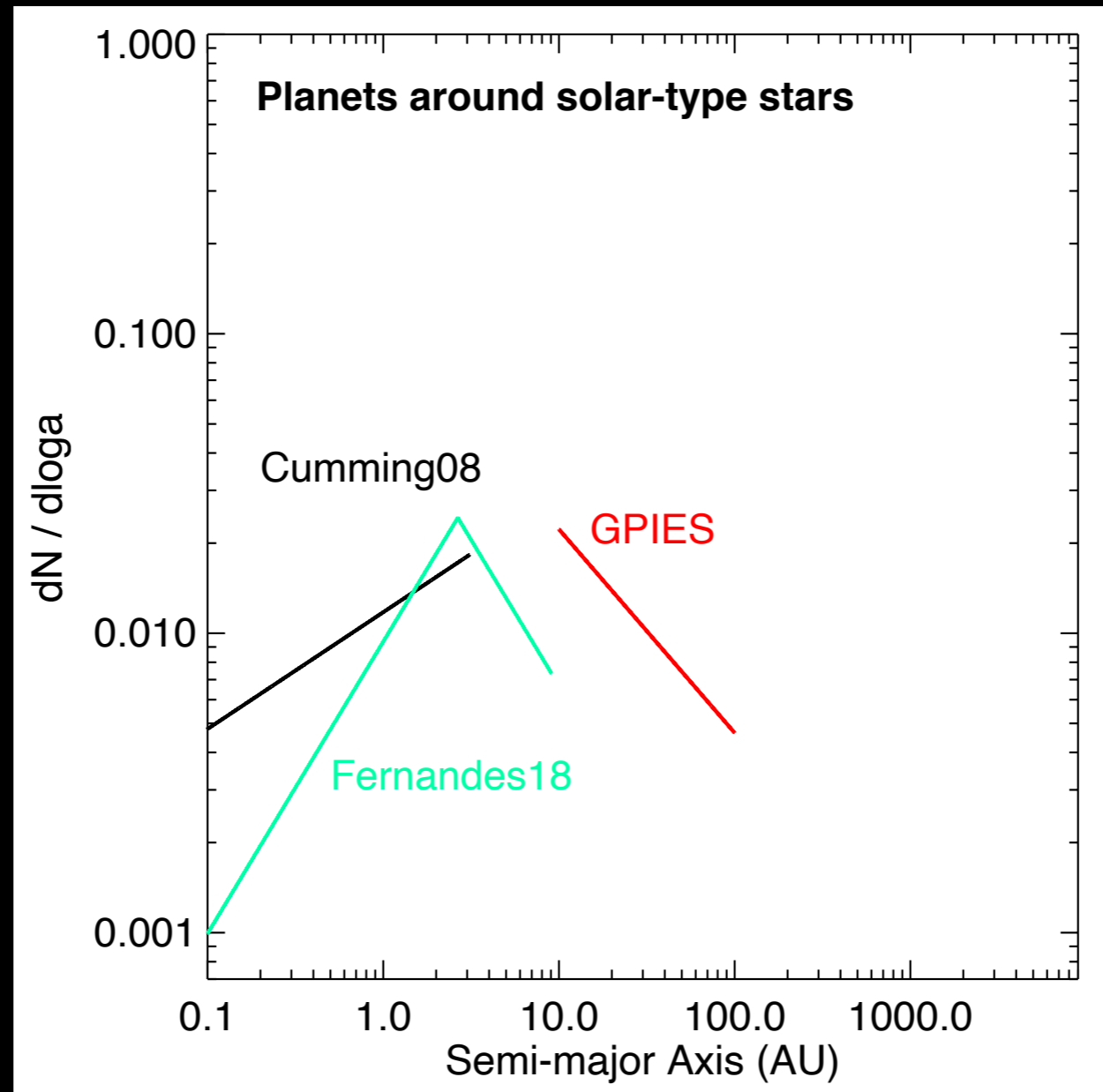
Giant planets demographics vs. semi-major axis



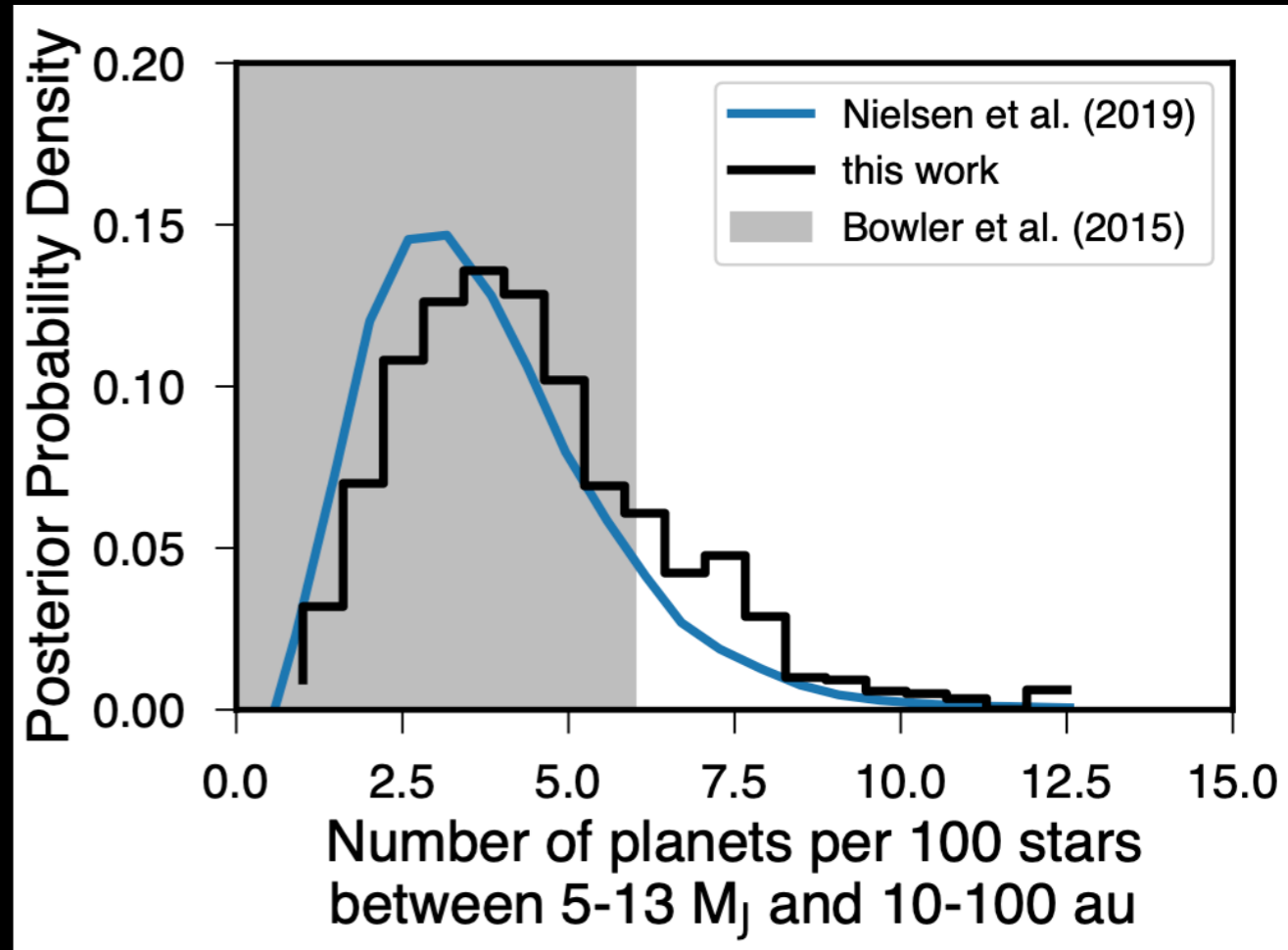
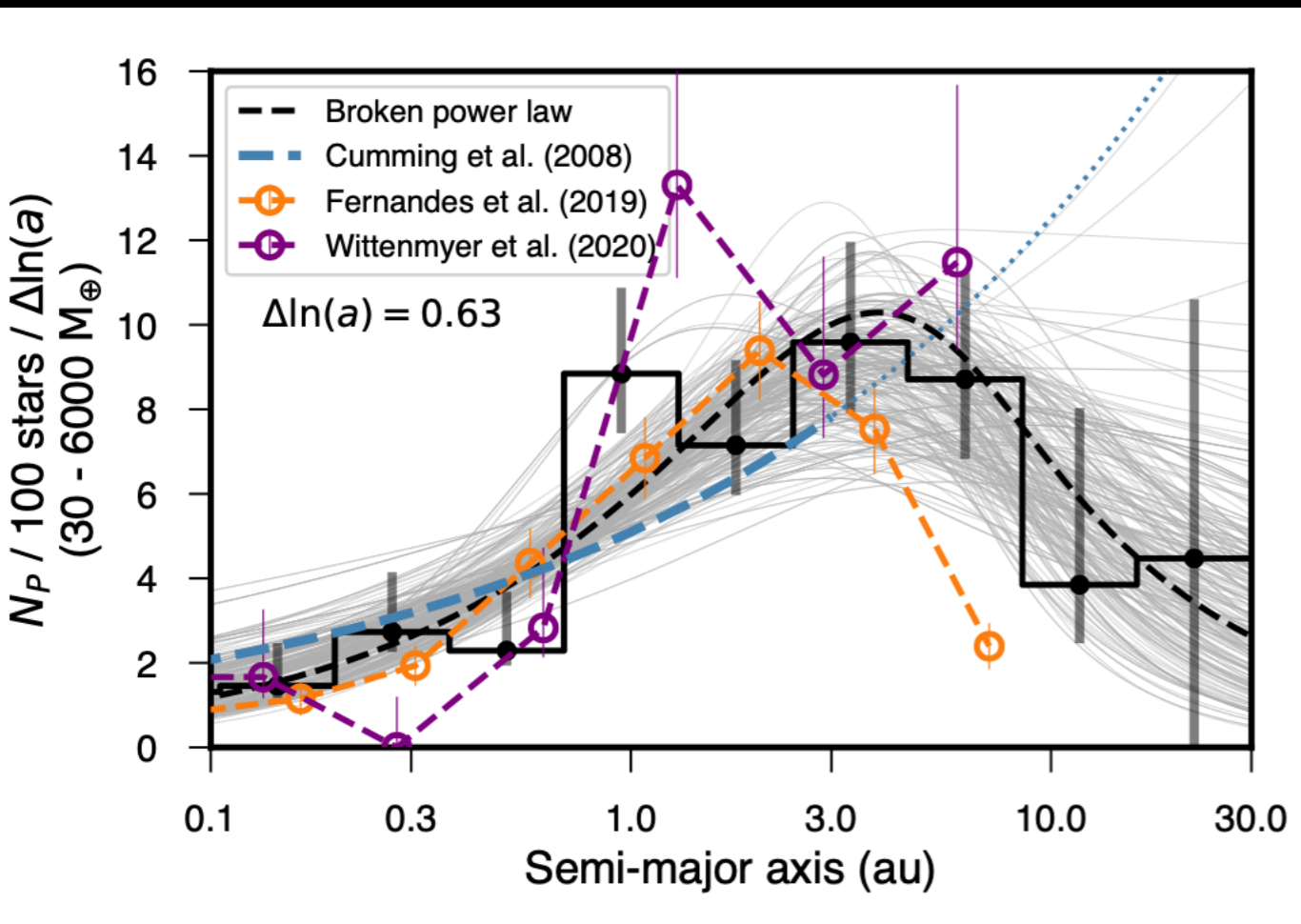
Giant planets demographics vs. semi-major axis



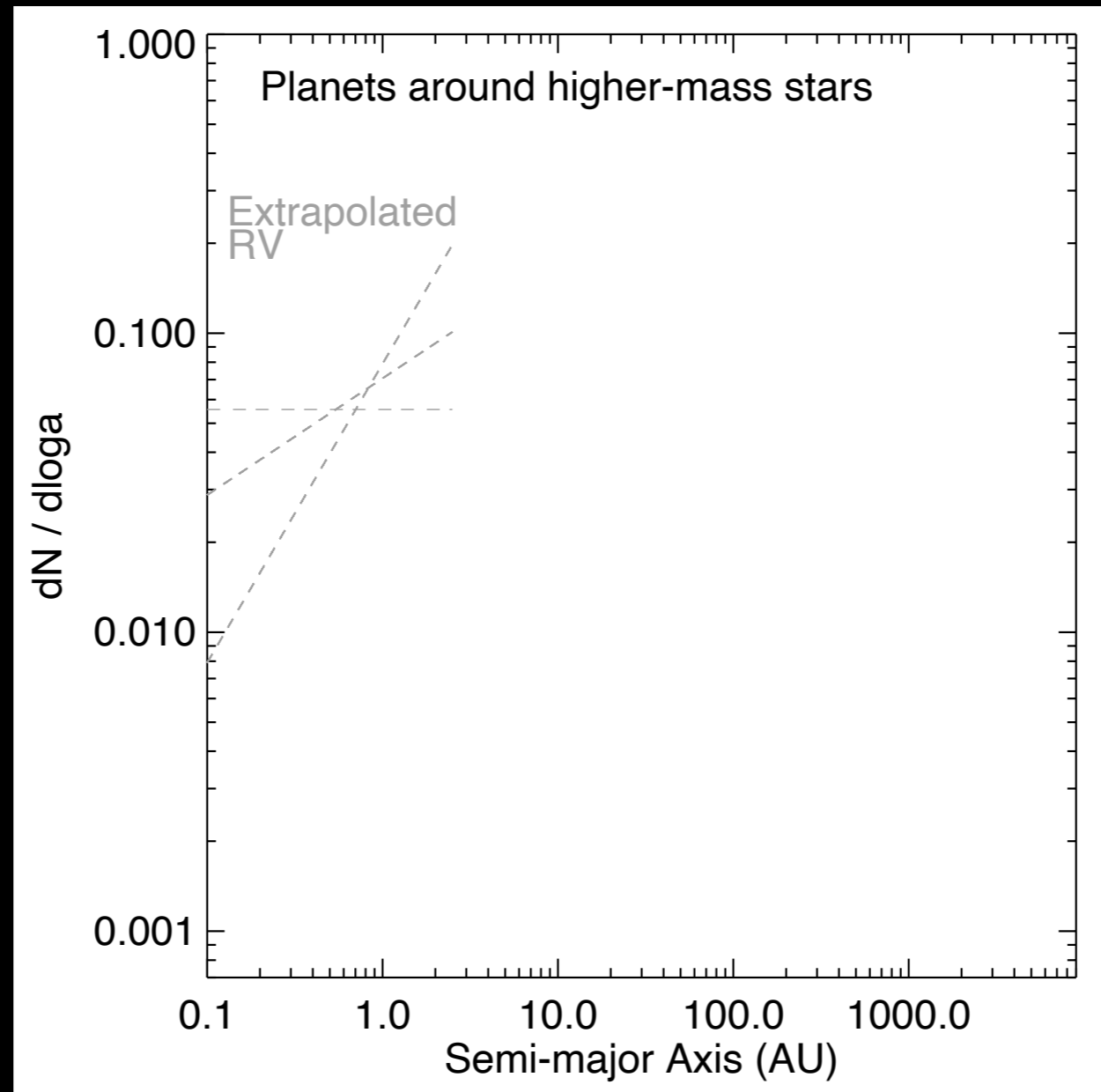
Giant planets demographics vs. semi-major axis



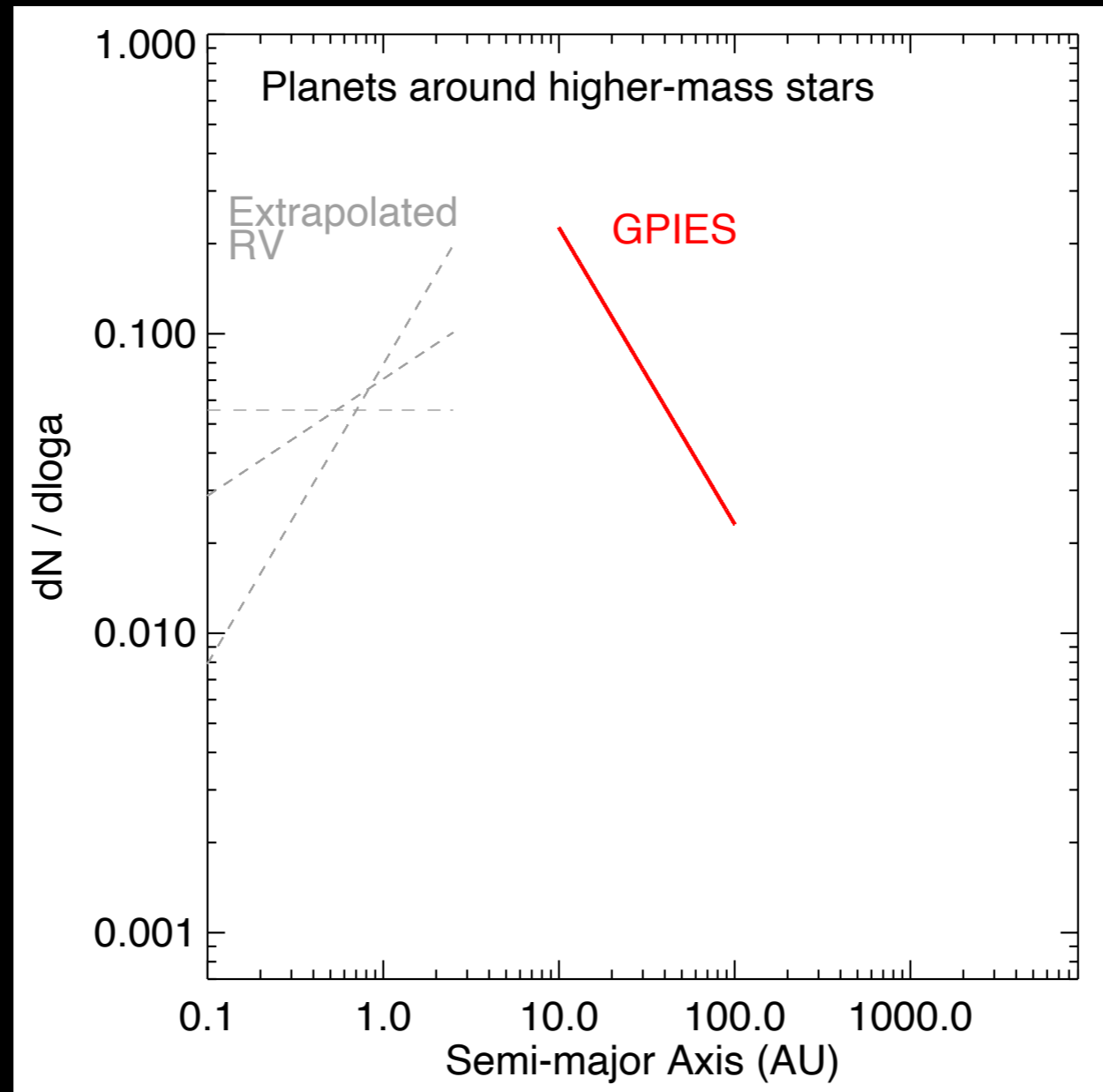
Giant planets demographics vs. semi-major axis



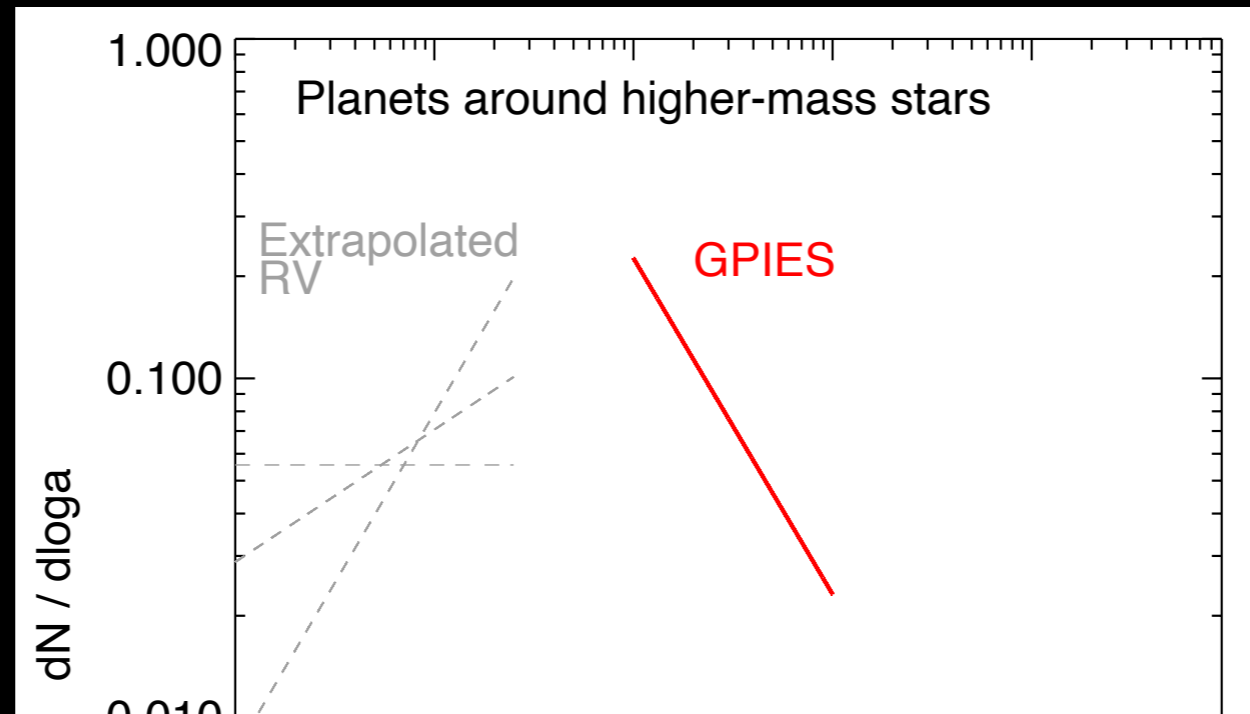
Giant planets demographics vs. semi-major axis



Giant planets demographics vs. semi-major axis



Giant planets demographics vs. semi-major axis

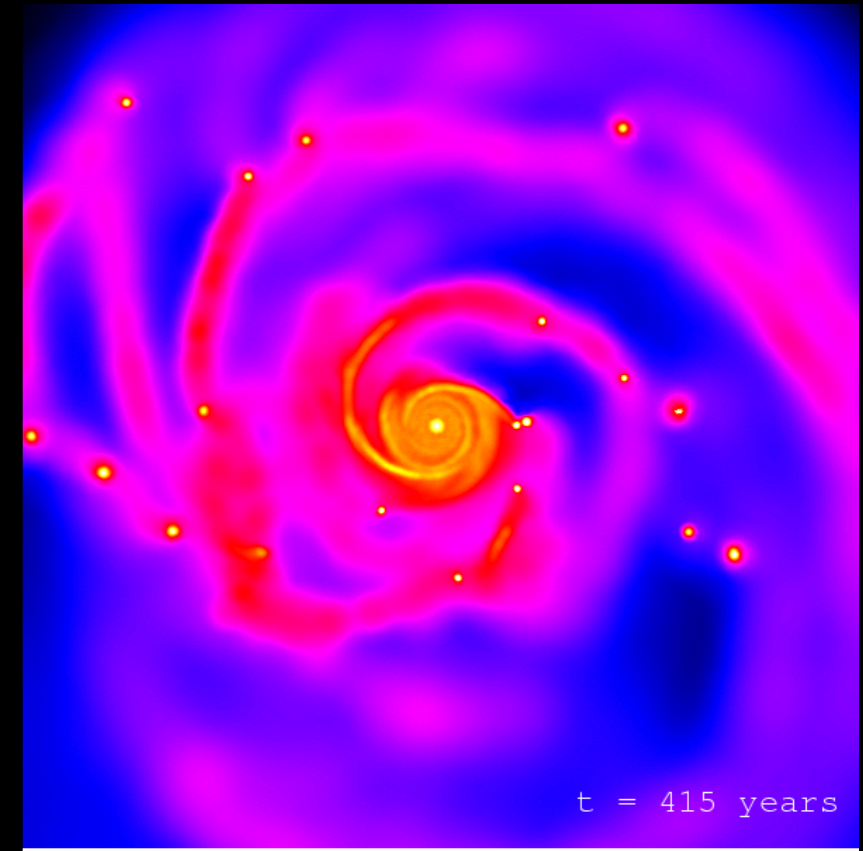


Conclusion 3: wide-separation giant planets and close-in giant planets do not appear to be drawn from the same power law

Comparing to predictions



Core accretion

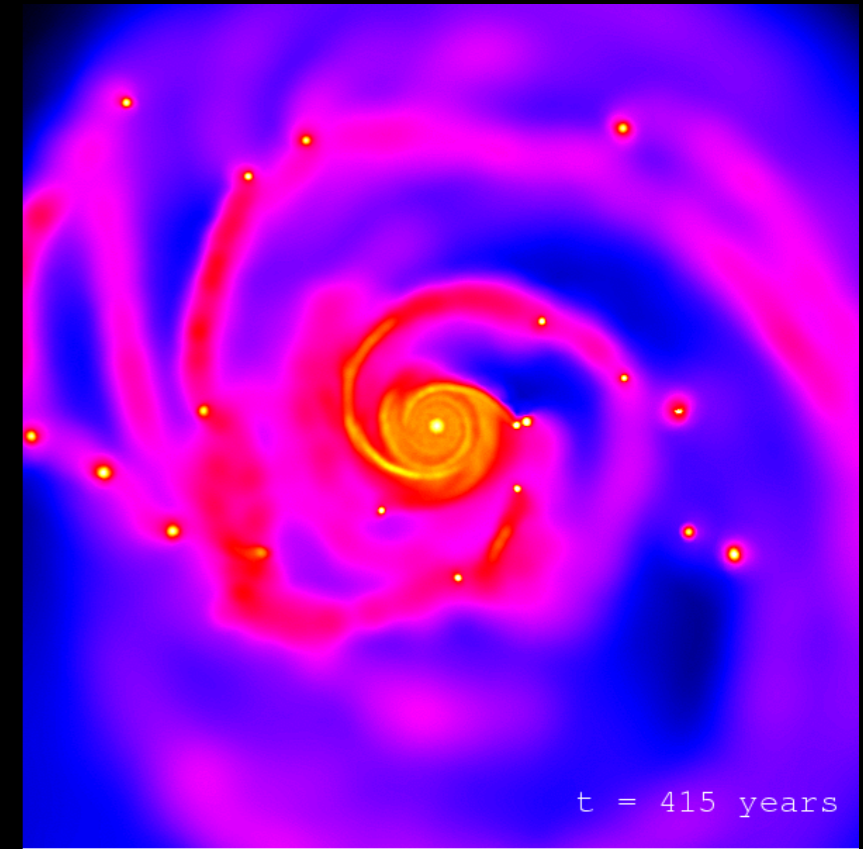


Gravitational Instability

Comparing to predictions



Core accretion
—More companions around
higher-mass stars



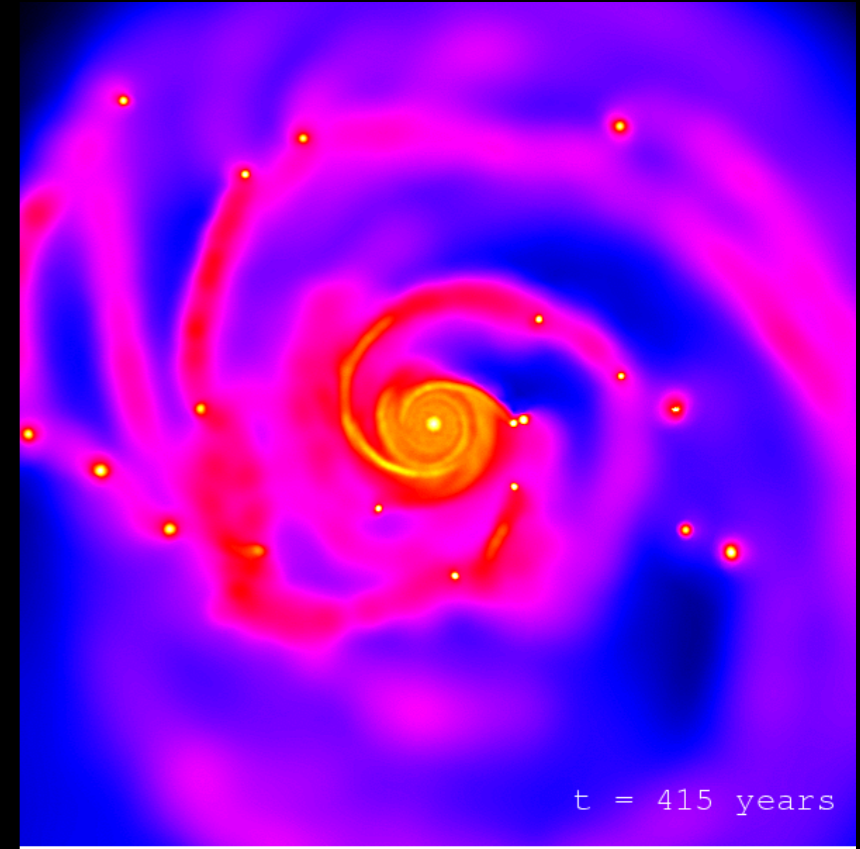
Gravitational Instability
—Weak dependence on mass of
host star

Comparing to predictions



Core accretion

- More companions around higher-mass stars
- More low-mass companions than high-mass



Gravitational Instability

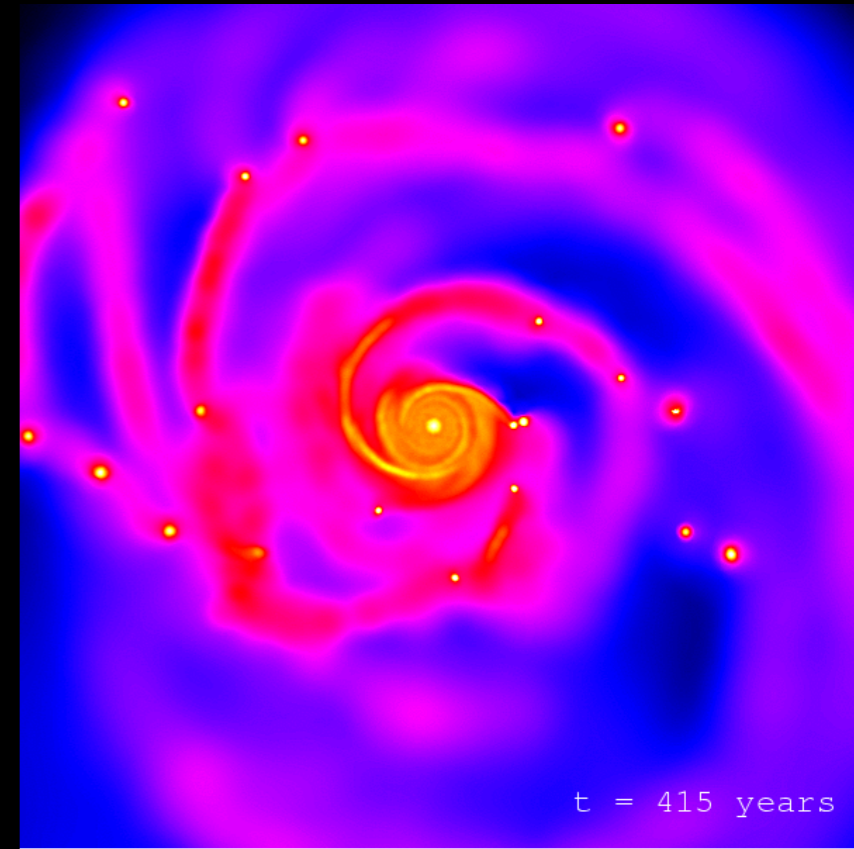
- Weak dependence on mass of host star
- More high-mass companions than low-mass

Comparing to predictions



Core accretion

- More companions around higher-mass stars
- More low-mass companions than high-mass
- More close-in companions than farther-out



Gravitational Instability

- Weak dependence on mass of host star
- More high-mass companions than low-mass
- Should be at much larger orbital separations

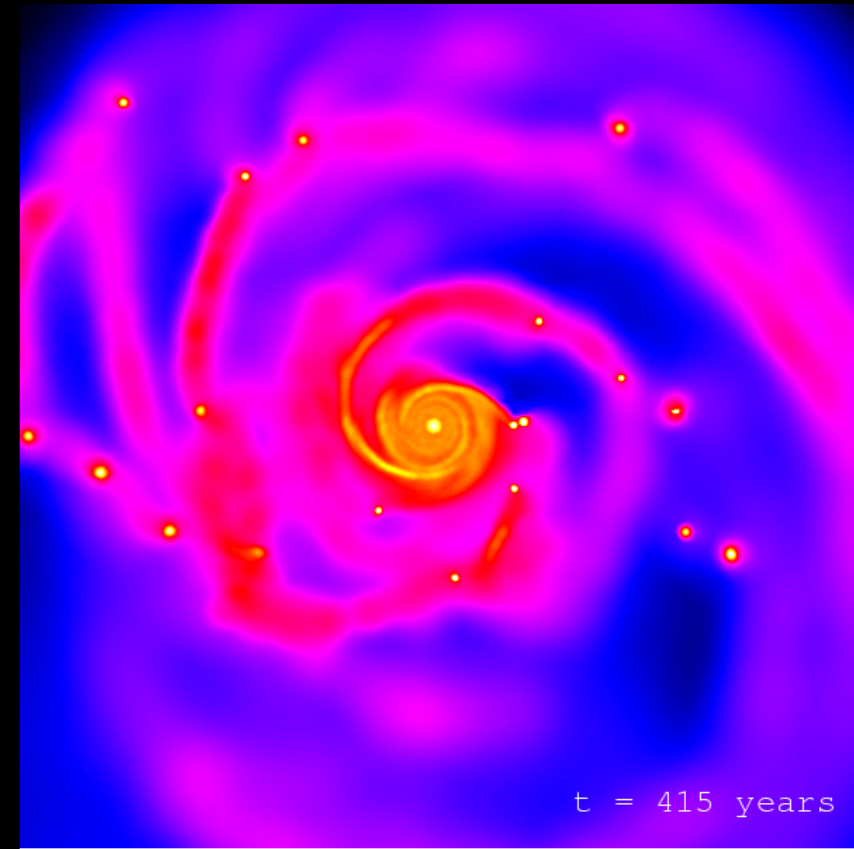
Comparing to predictions



Core accretion

- More companions around higher-mass stars
- More low-mass companions than high-mass
- More close-in companions than farther-out

GPIES Planets



Gravitational Instability

- Weak dependence on mass of host star
- More high-mass companions than low-mass
- Should be at much larger orbital separations

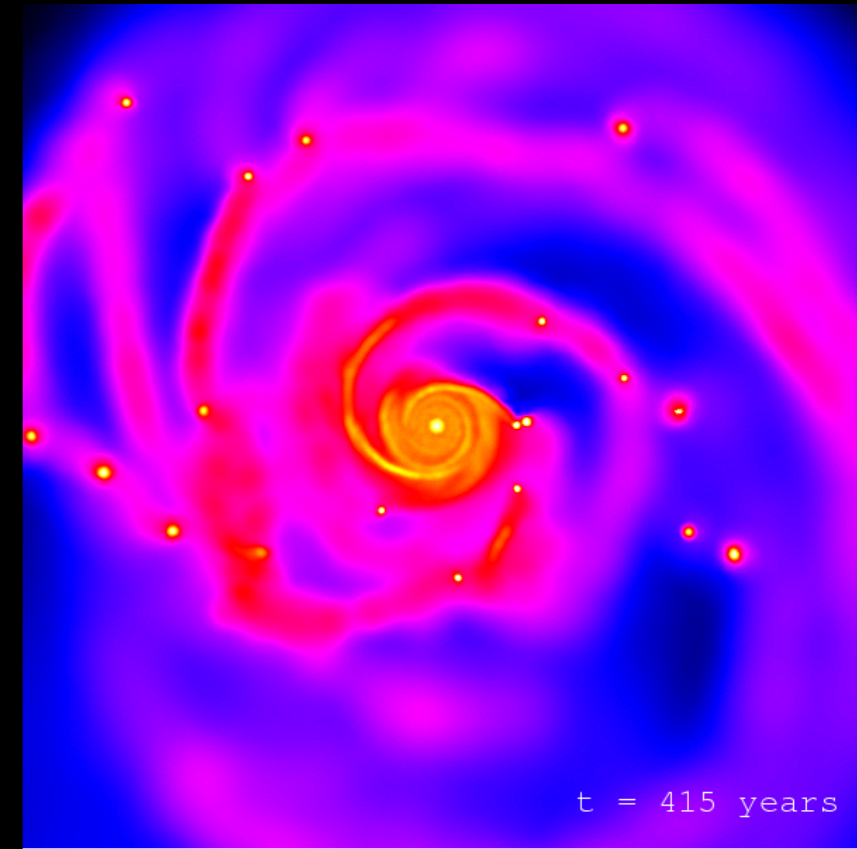
Comparing to predictions



Core accretion

- More companions around higher-mass stars
- More low-mass companions than high-mass
- More close-in companions than farther-out

GPIES Planets



Gravitational Instability

- Weak dependence on mass of host star
- More high-mass companions than low-mass
- Should be at much larger orbital separations

GPIES Brown dwarfs

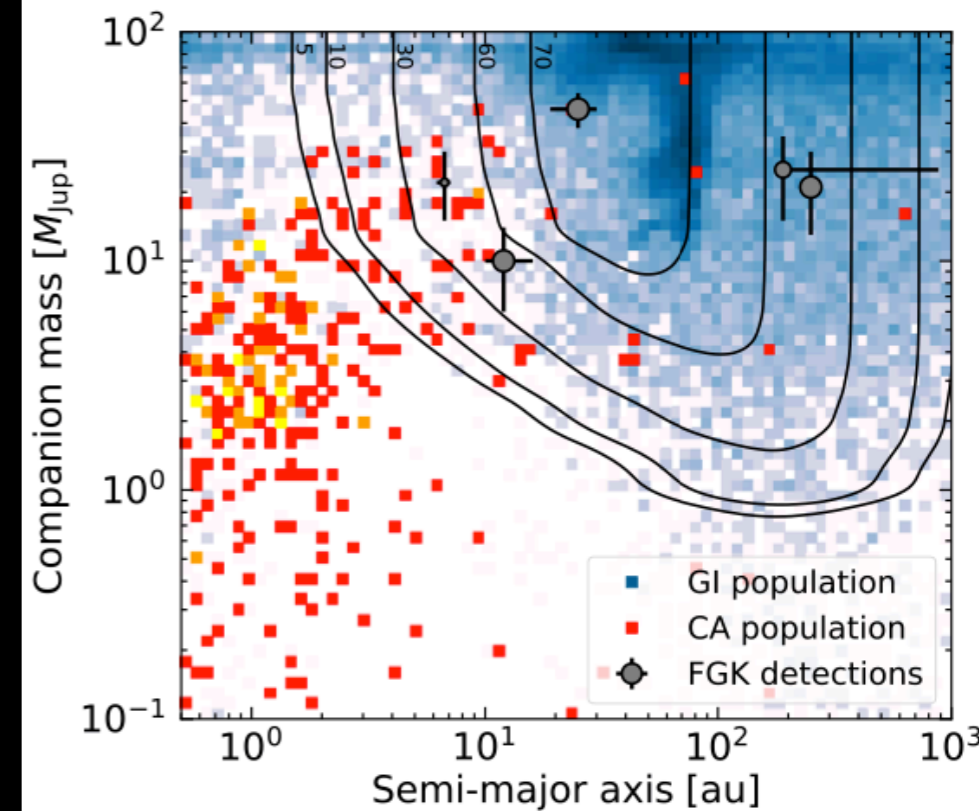
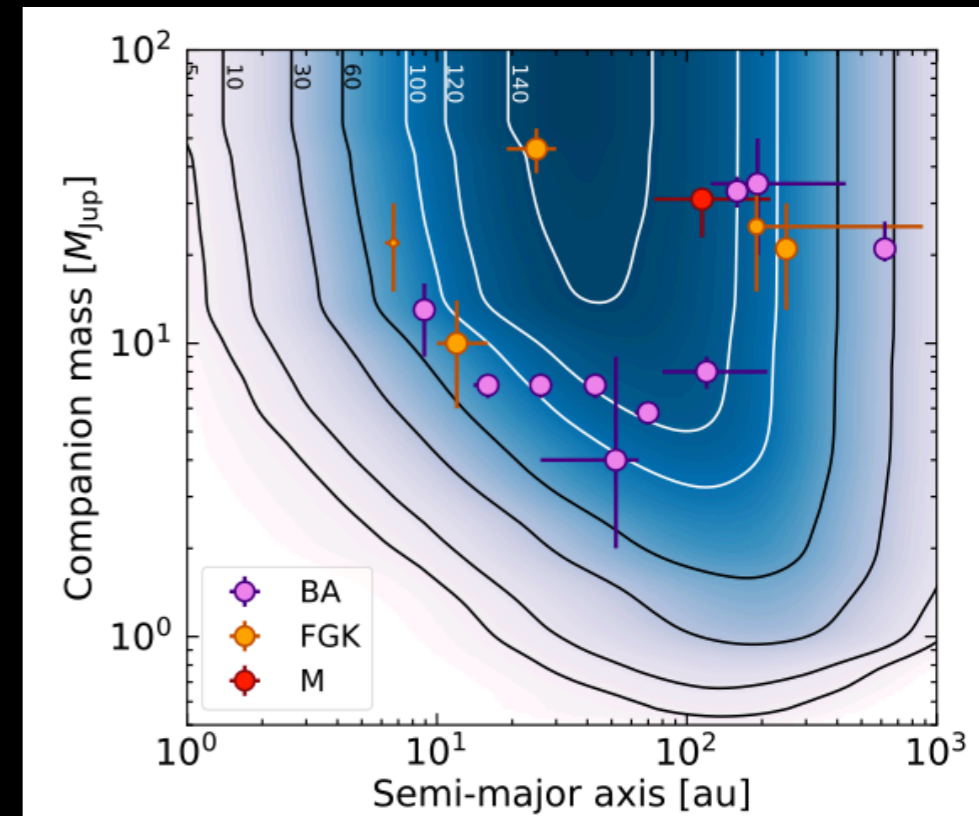
VLT SPHERE SHINE

Demographics from the first 150 stars observed by SHINE

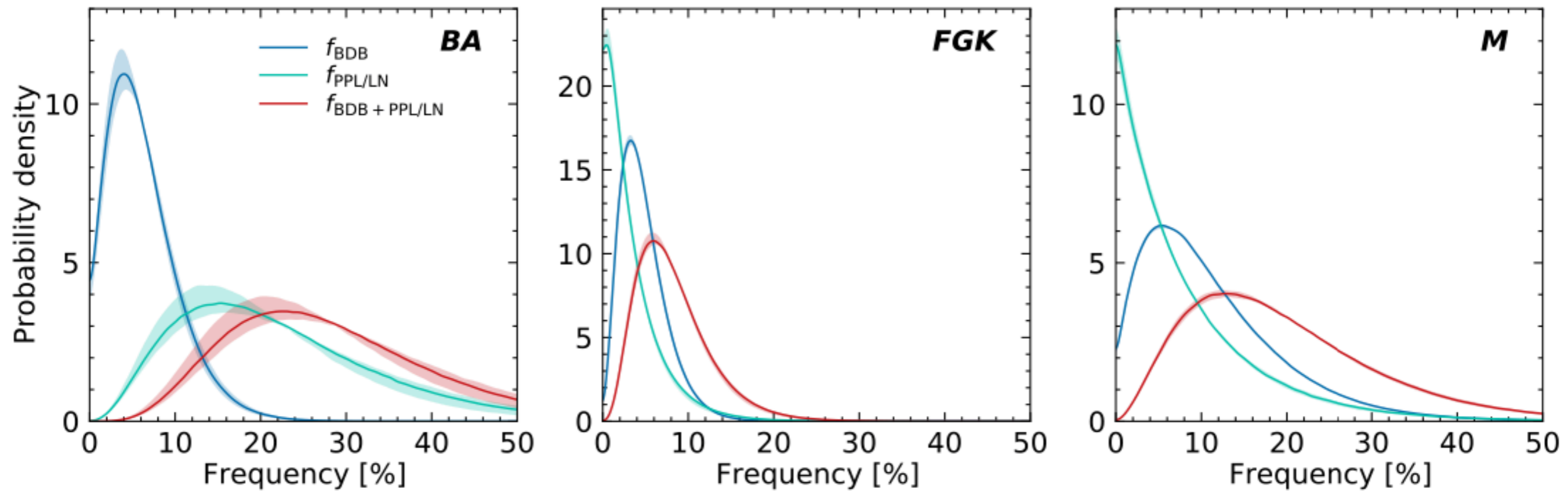
Population synthesis:
gravitational instability or
core accretion alone can't
reproduce substellar
companions to FGK stars

Mixture of two mechanisms
is plausible

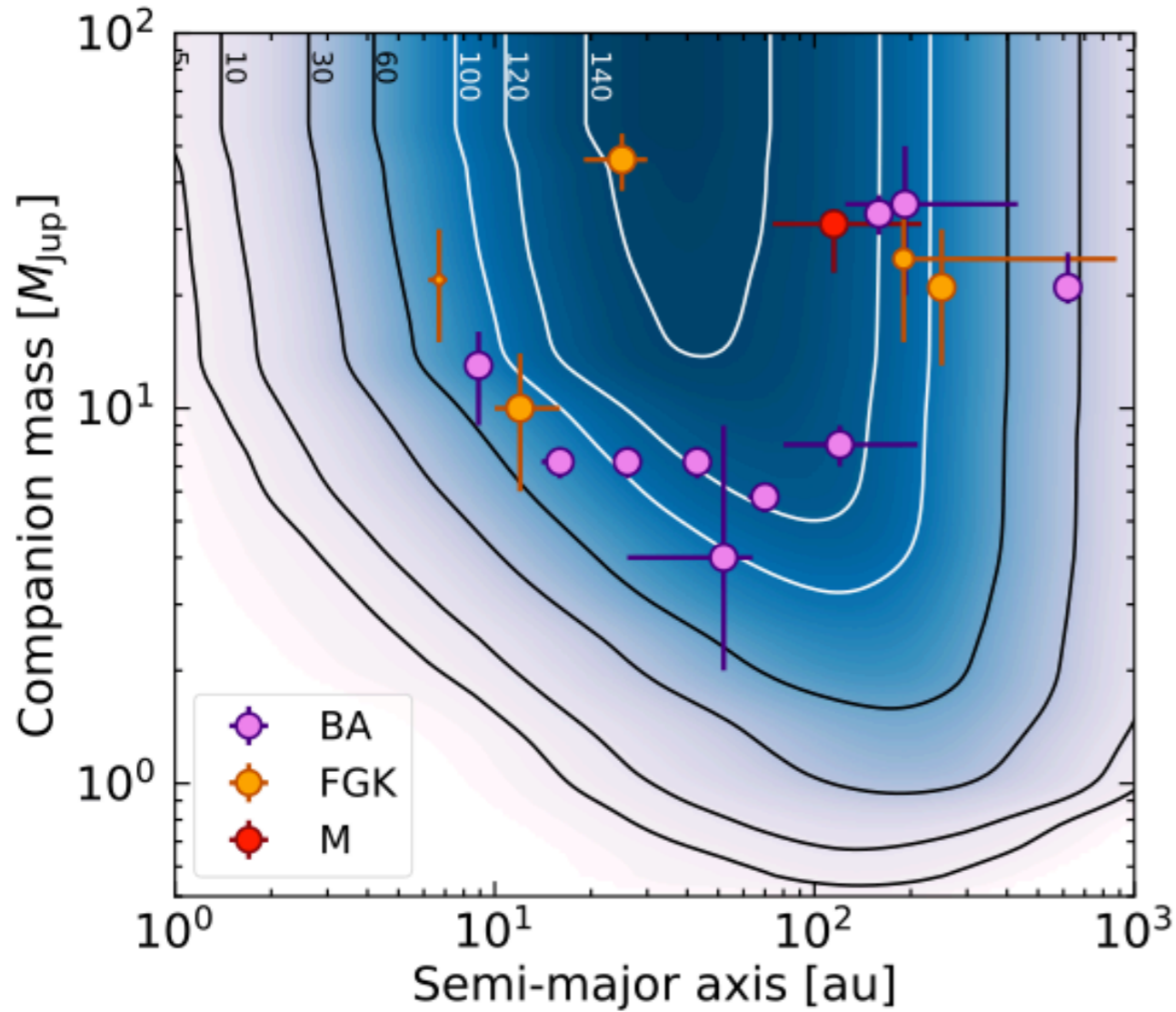
Vigan et al. 2020



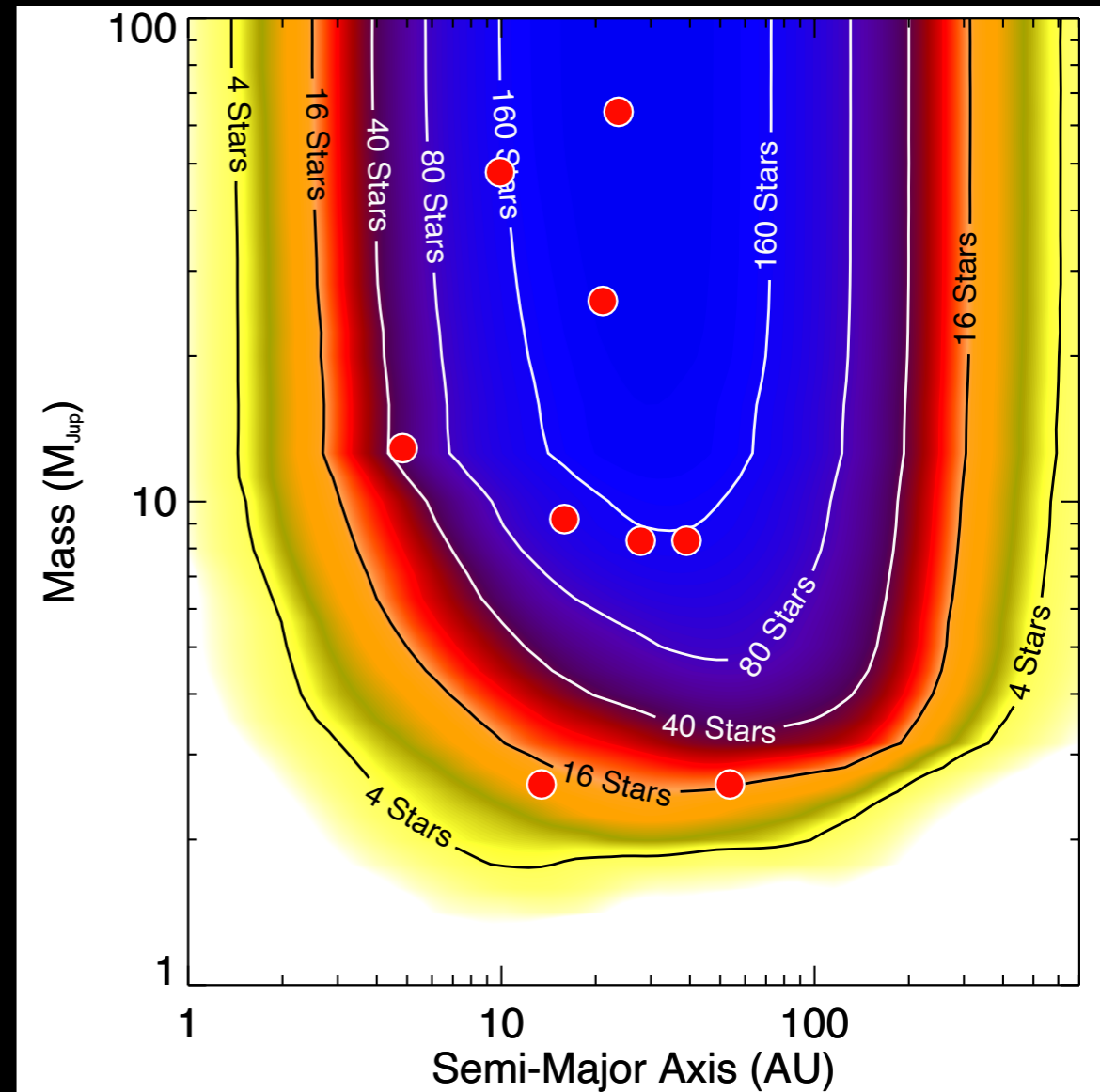
VLT SPHERE SHINE



SHINE and GPIES



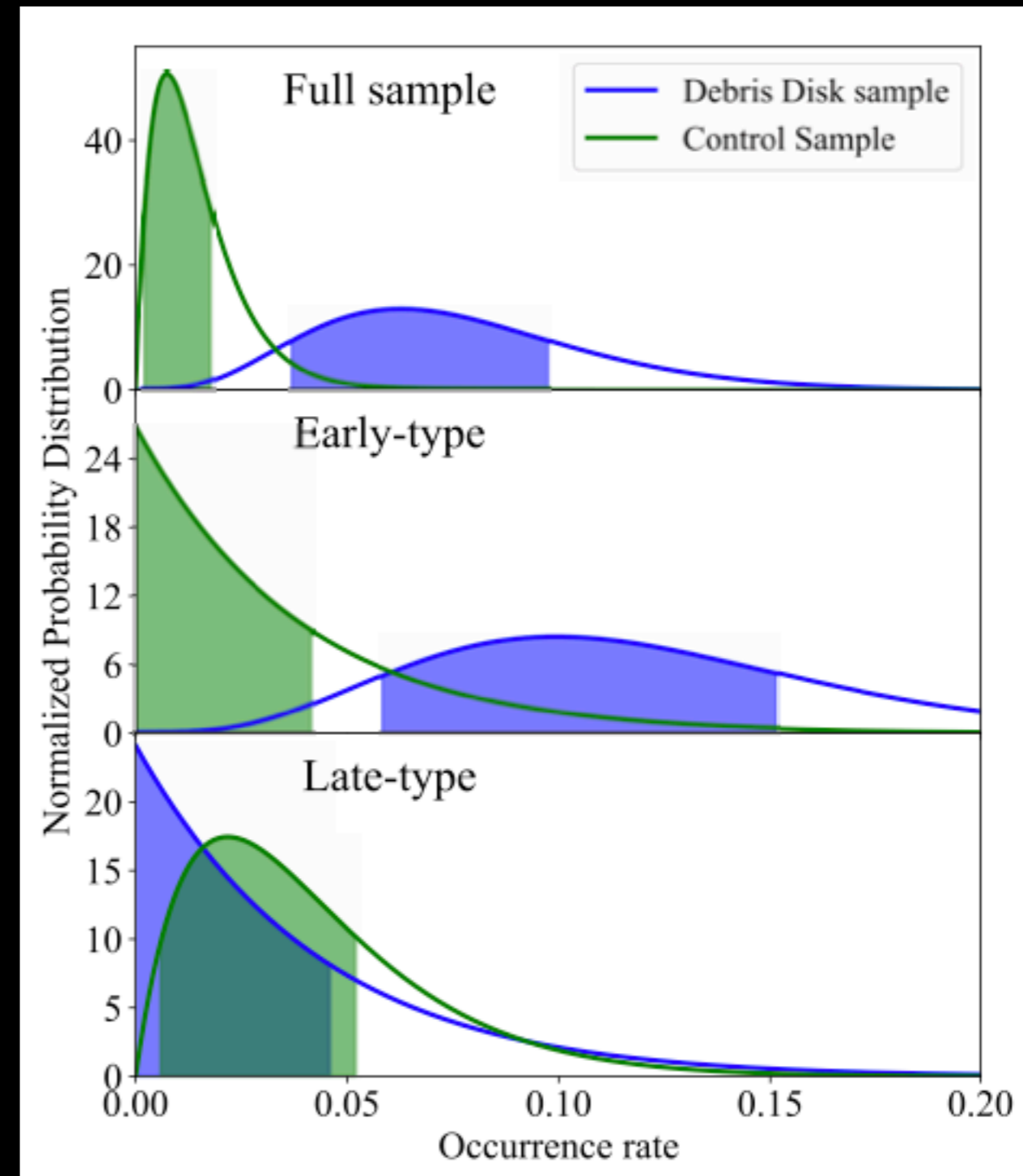
Vigan et al. 2020



Nielsen et al. 2019

Demographics of debris disk stars and exoplanets

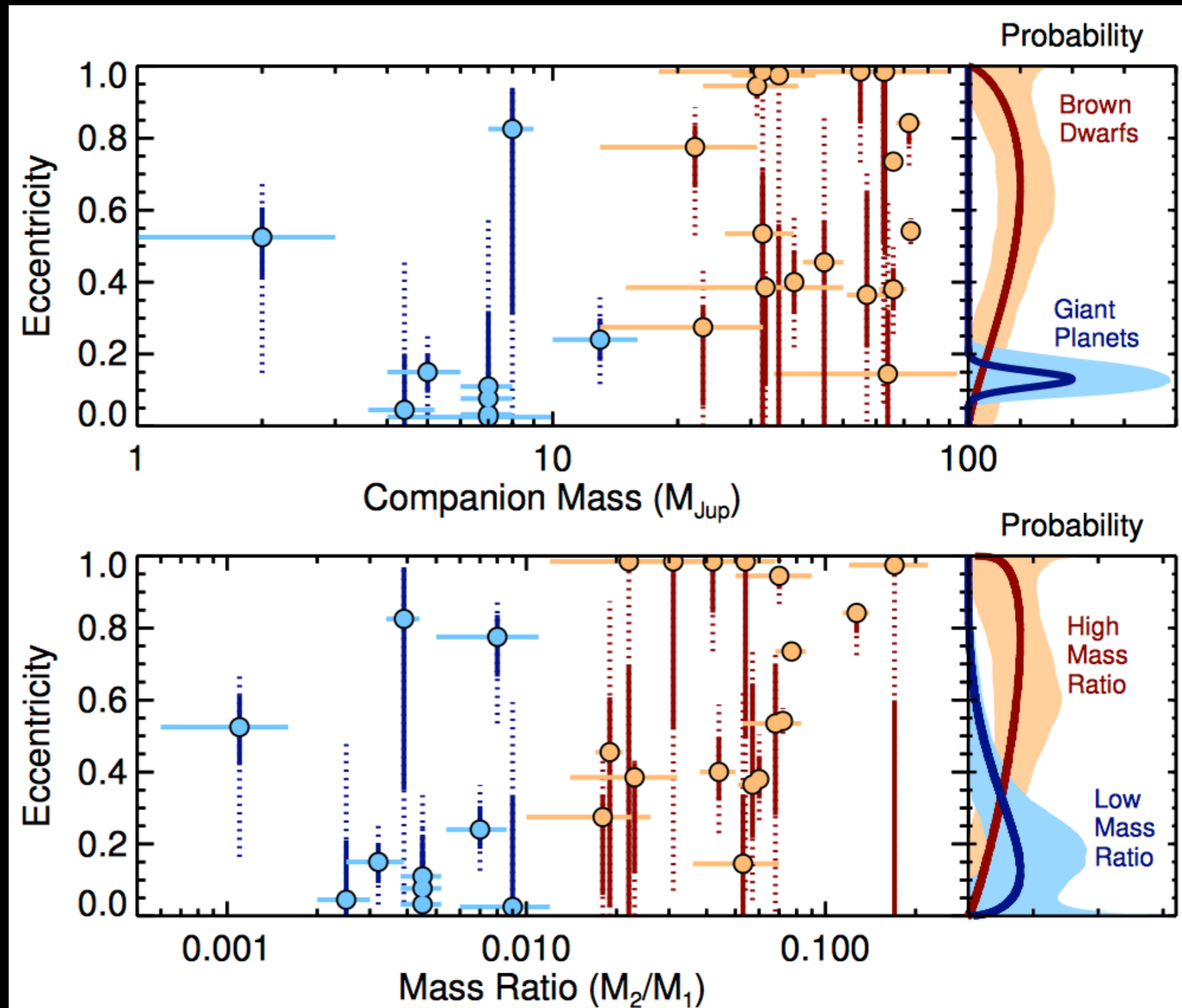
Early-type stars with debris disks are more likely to have a wide-separation giant planet



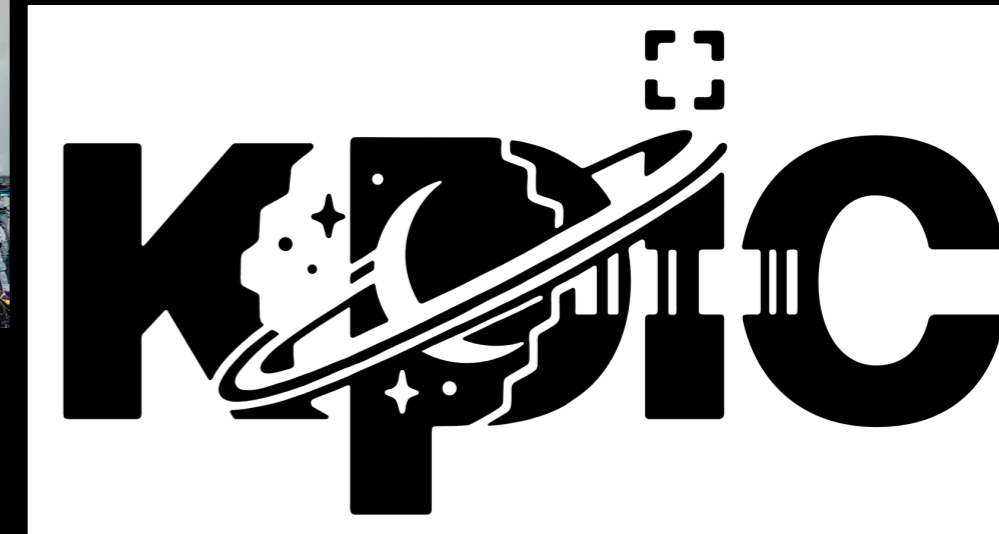
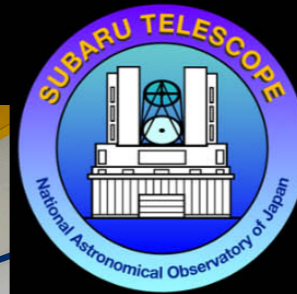
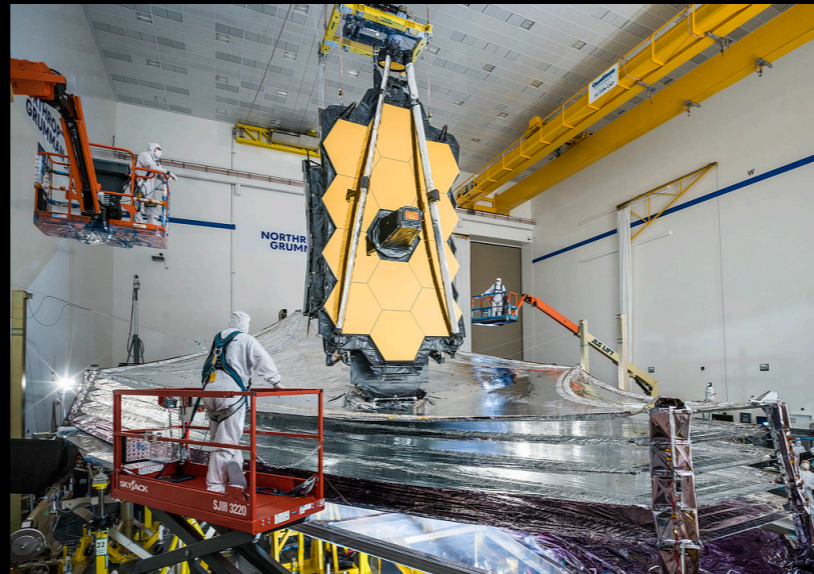
Demographics of substellar companions: eccentricity

Directly imaged brown dwarf and giant planet companions to have different eccentricity distributions

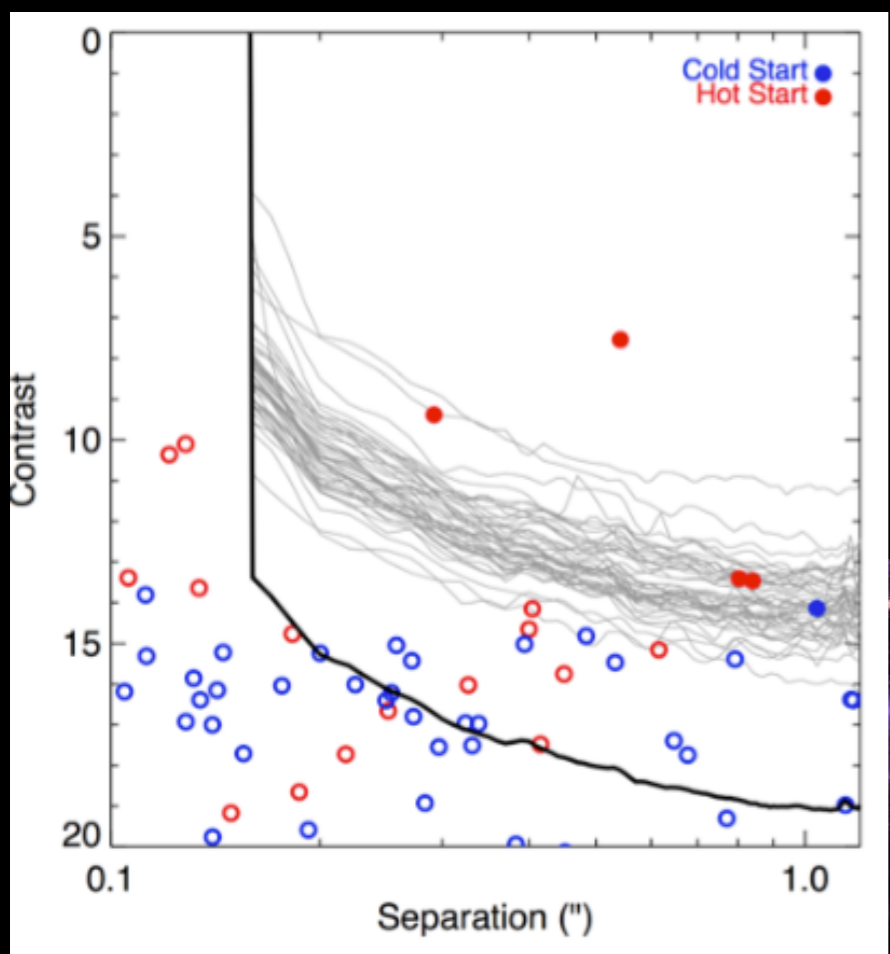
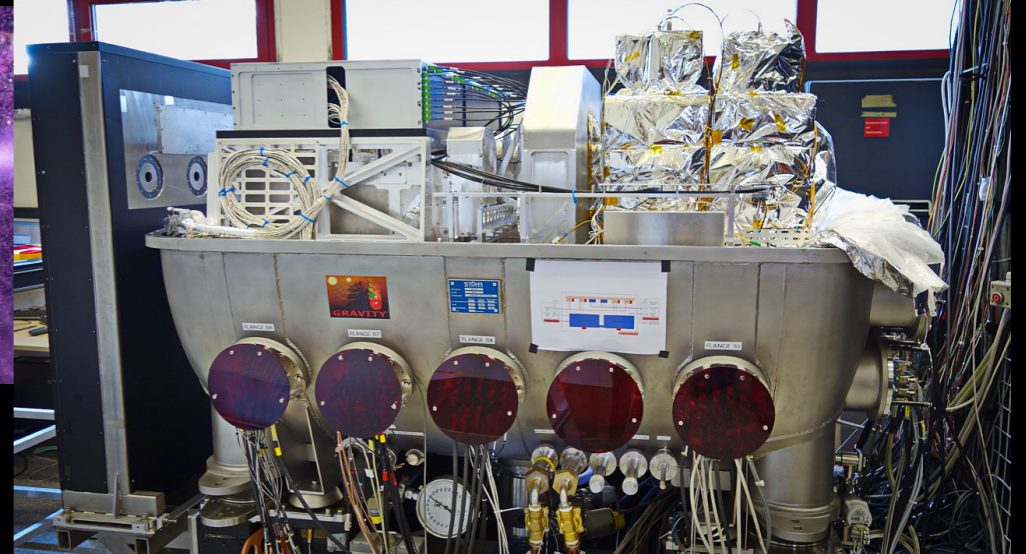
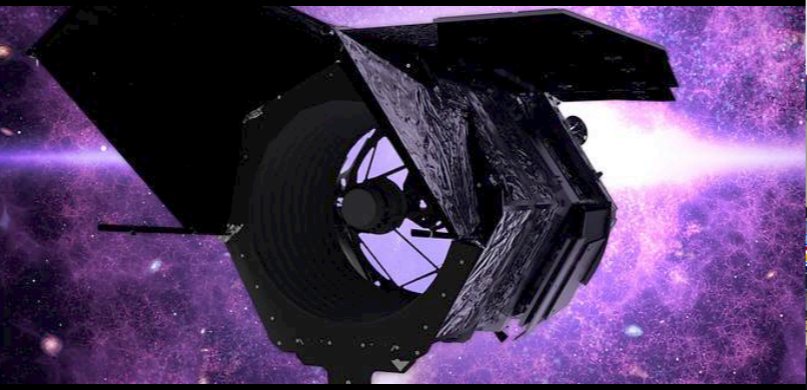
Consistent with different formation mechanisms



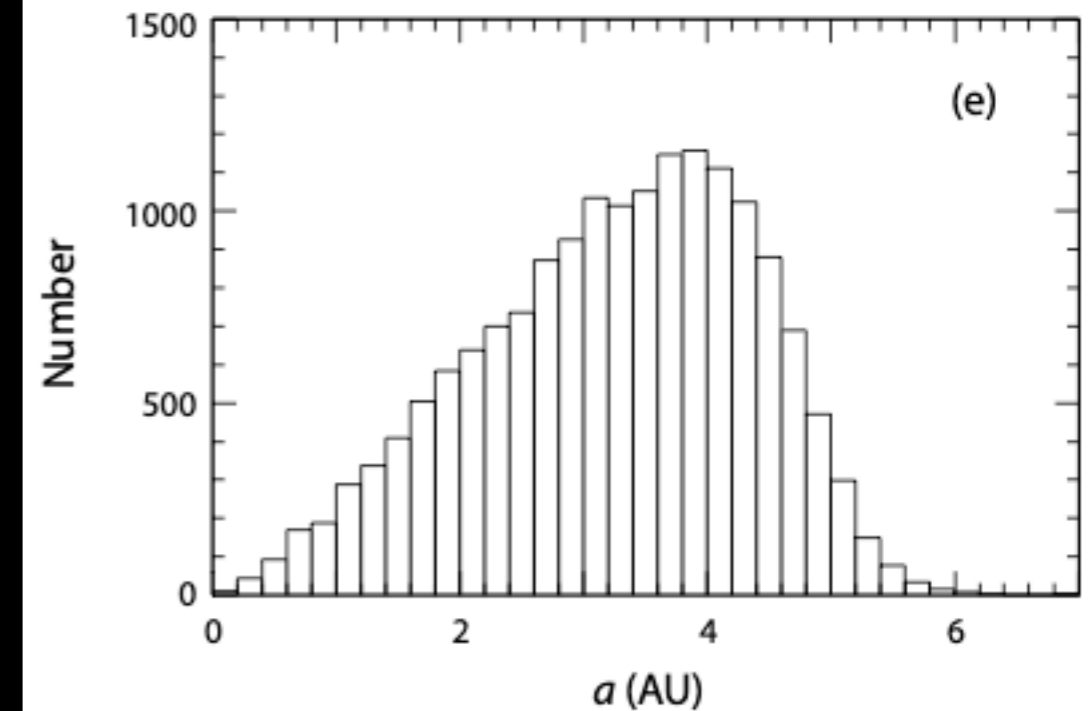
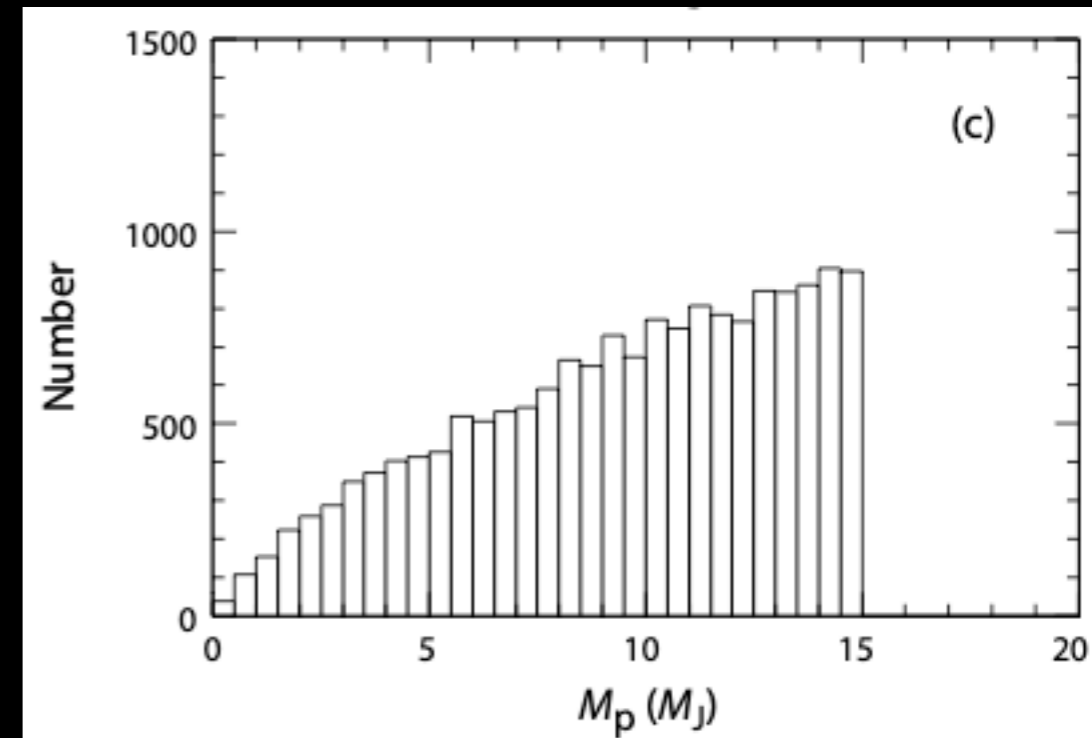
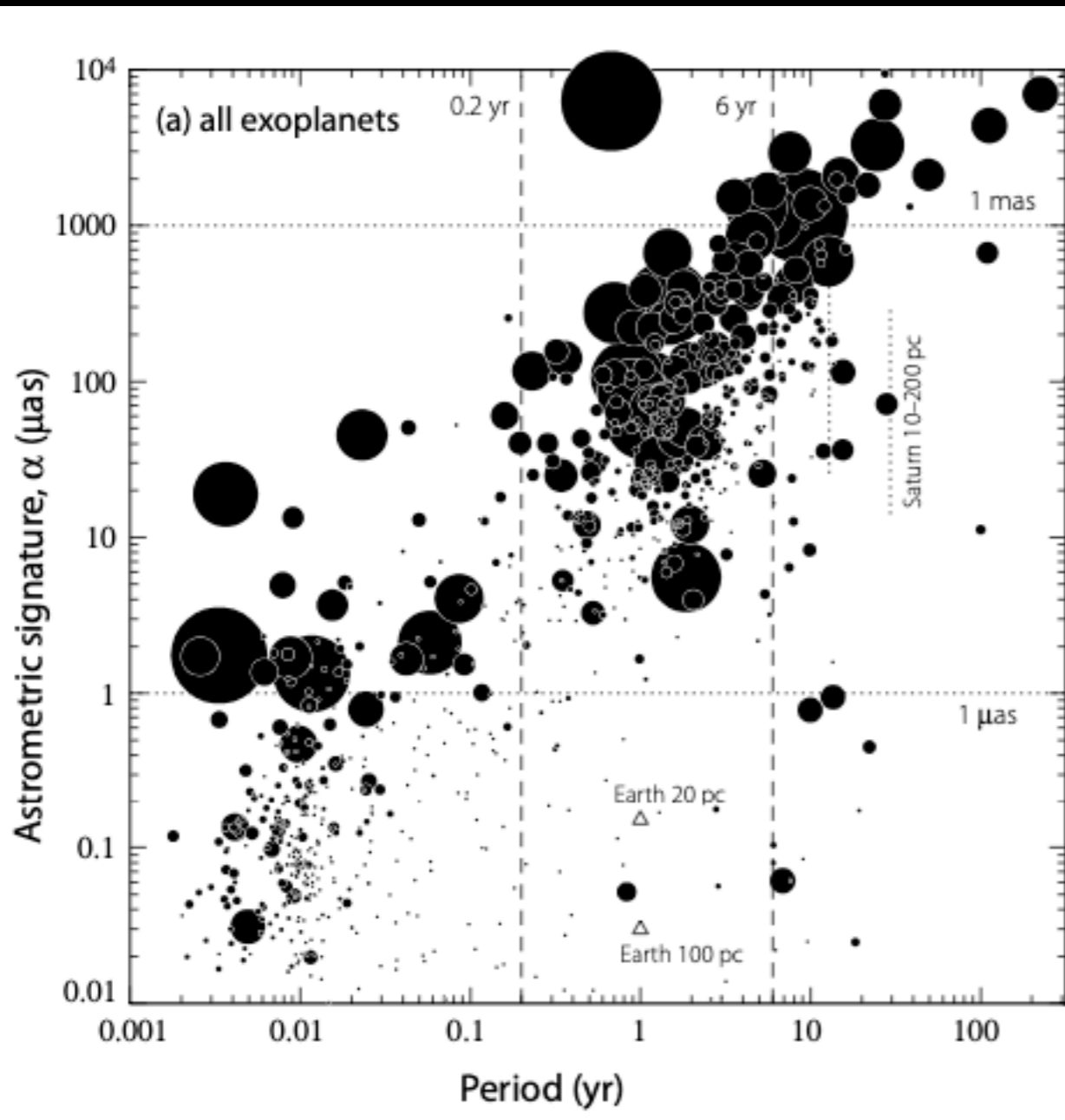
The future of young planet demographics: direct imaging



VLT GRAVITY

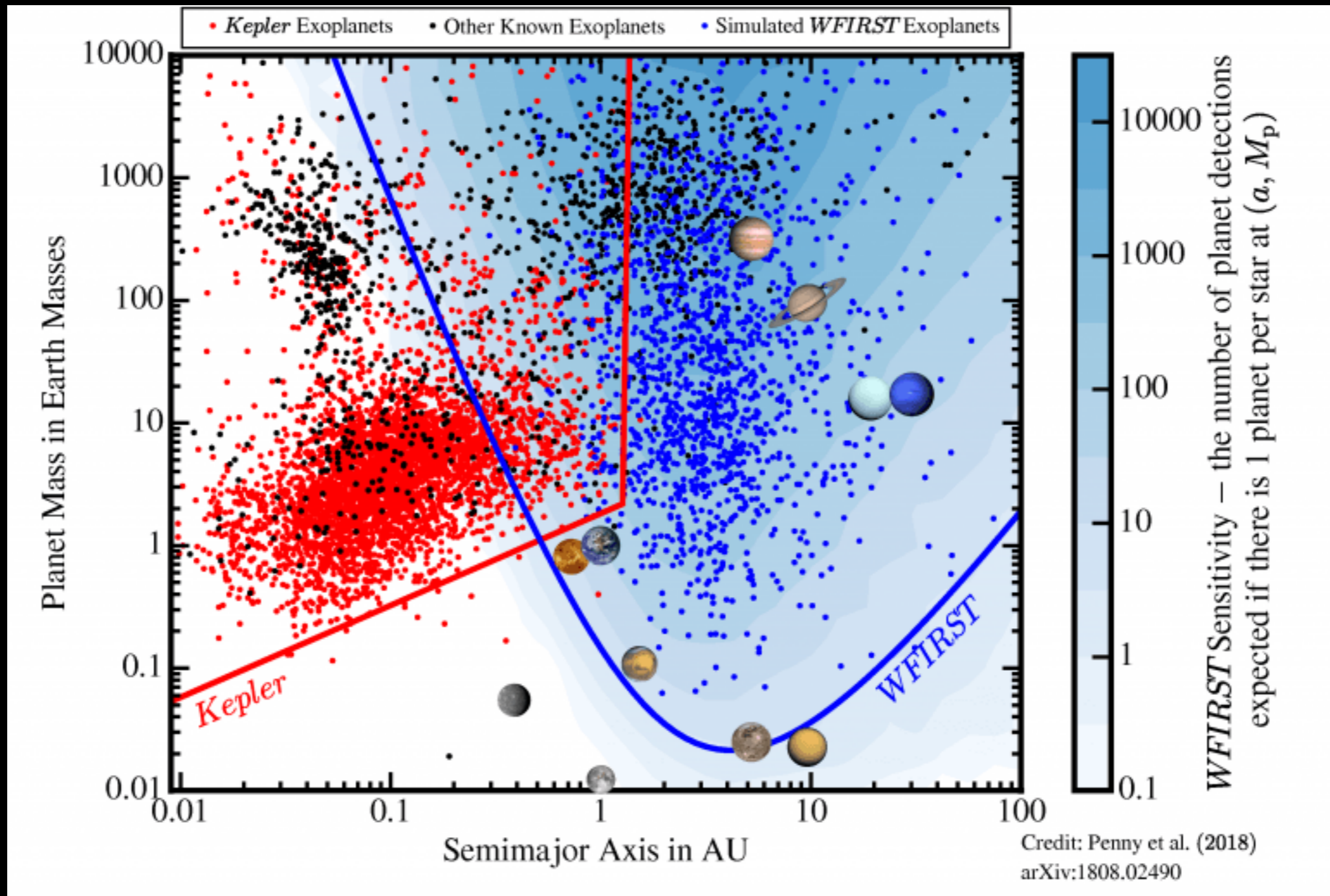


The future of young planet demographics: astrometry



Perryman et al. 2015

The future of planet demographics: microlensing



Conclusions

Exoplanet demographics let us test predictions from theories of planet formation and evolution

Demographics results from direct imaging surveys currently favor core accretion for wide-separation giant planets, but with limited statistical significance

Future instrumentation and telescope will enable more precise measurements of giant planet demographics, with more overlap between direct imaging and other techniques

Exoplanet Demographics

NASA SIG2 (Science Interest Group)
on Exoplanet Demographics: [https://
exoplanets.nasa.gov/exep/exopag/sigs/](https://exoplanets.nasa.gov/exep/exopag/sigs/)

Exoplanet Demographics papers
on the NASA Exoplanet Archive:
[https://
exoplanetarchive.ipac.caltech.edu/
docs/occurrence_rate_papers.html](https://exoplanetarchive.ipac.caltech.edu/docs/occurrence_rate_papers.html)

