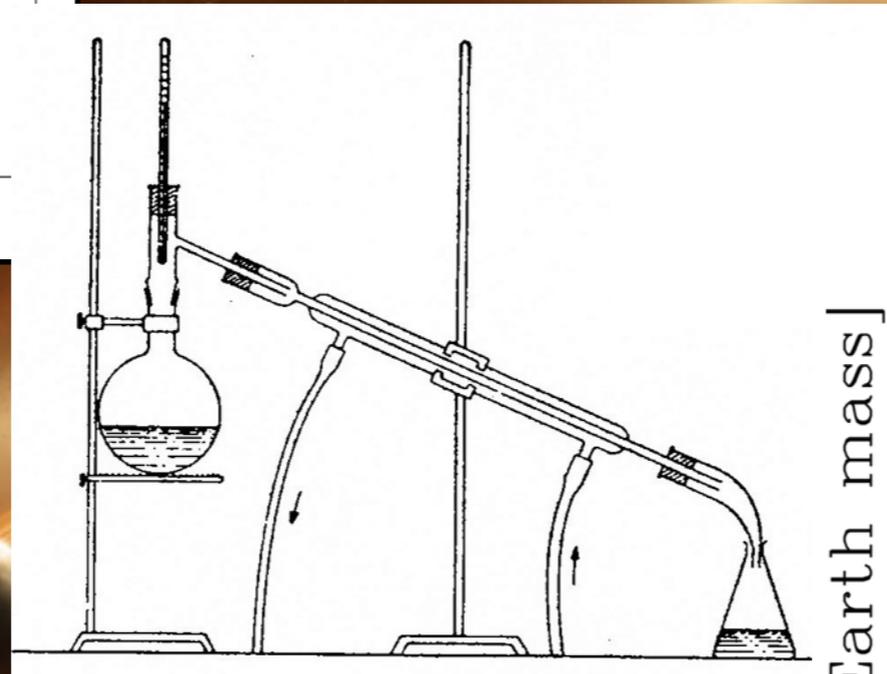
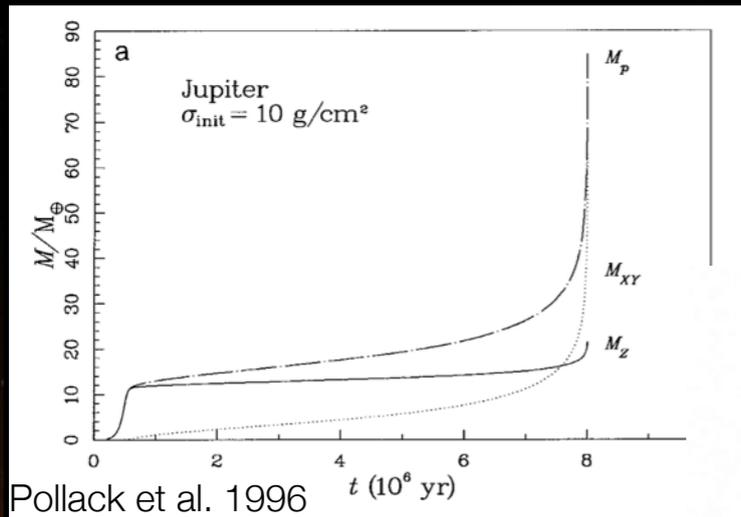
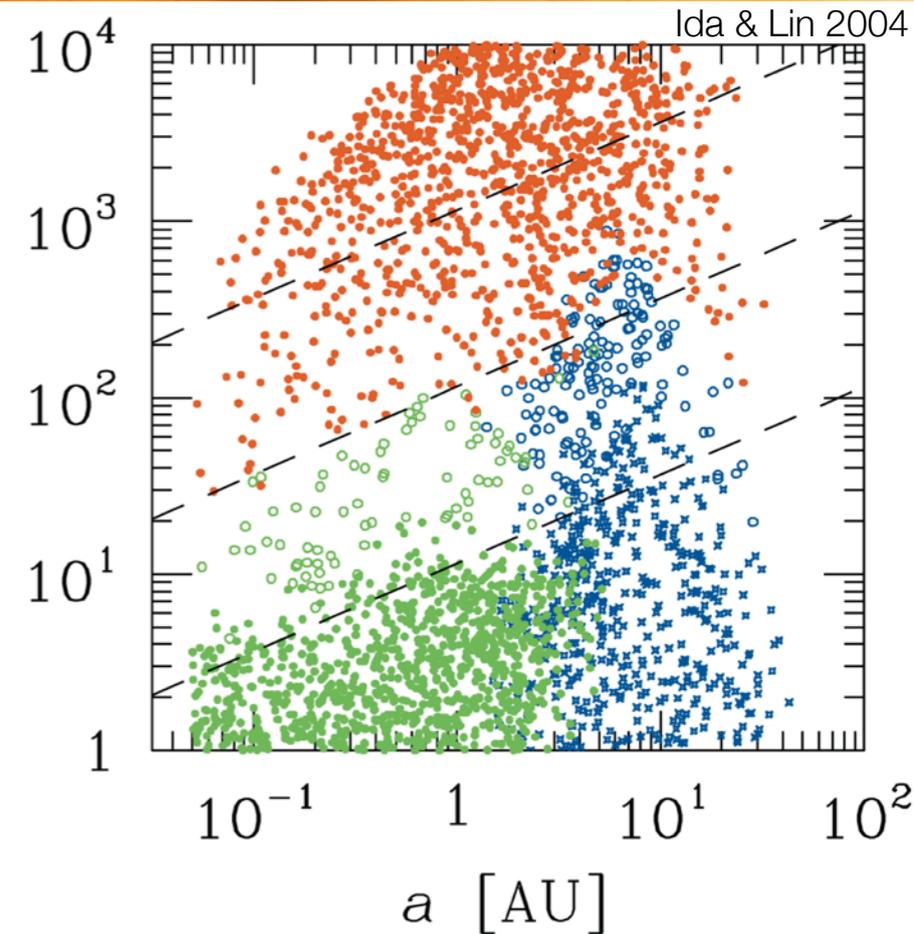


# Population synthesis models based on core accretion



$M_p$  [Earth mass]



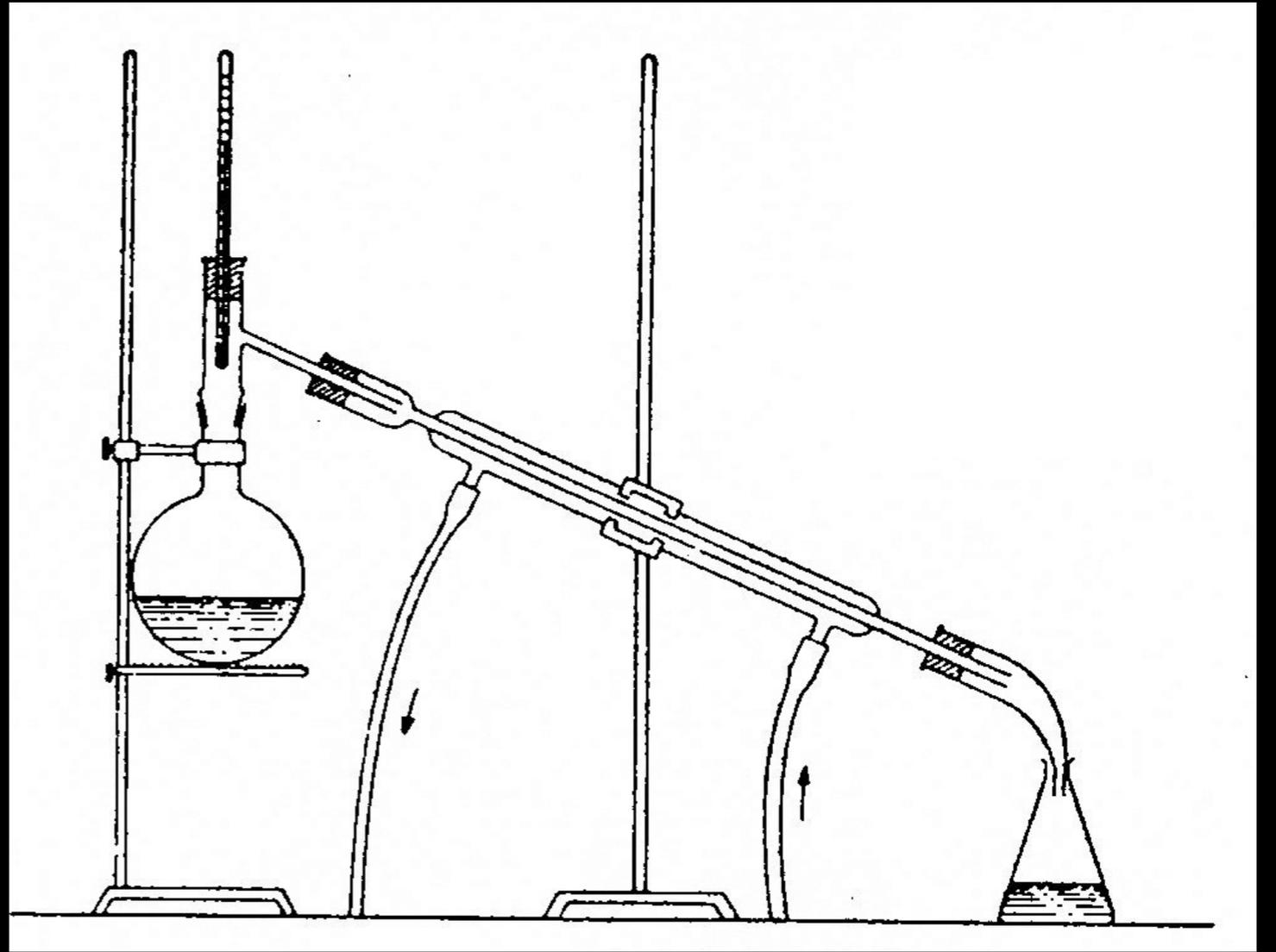
Chris Mordasini  
University of Bern, Switzerland



# *Contents*

---

1. Introduction: population synthesis principle
2. Input physics
3. Statistical results on masses
4. Statistical results on radii
5. Conclusions



1.  
Introduction: population  
synthesis principle



# Motivation

Many detections from space and ground (HARPS, Kepler, ...). More to come (SPHERE, GPI, TESS, CHEOPS, Gaia, ESPRESSO, PLATO, NGTS, CARMENES, WFIRST, ...)

Field observationally driven, theory struggles to keep up. Improve theoretical understanding by comparing theory and observation.

Difficulty: planet formation theory difficult to test directly with observations: specific physical process convoluted with many other.

But: high number of exoplanets: can be treated as a population.

- statistical constraints

- data from many different techniques  $\Rightarrow$  much more stringent constraints on theoretical models by combining  $M$ ,  $a$ ,  $e$ ,  $R$ ,  $L$ , spectra, ...

With population synthesis, we can use this wealth of constraints.

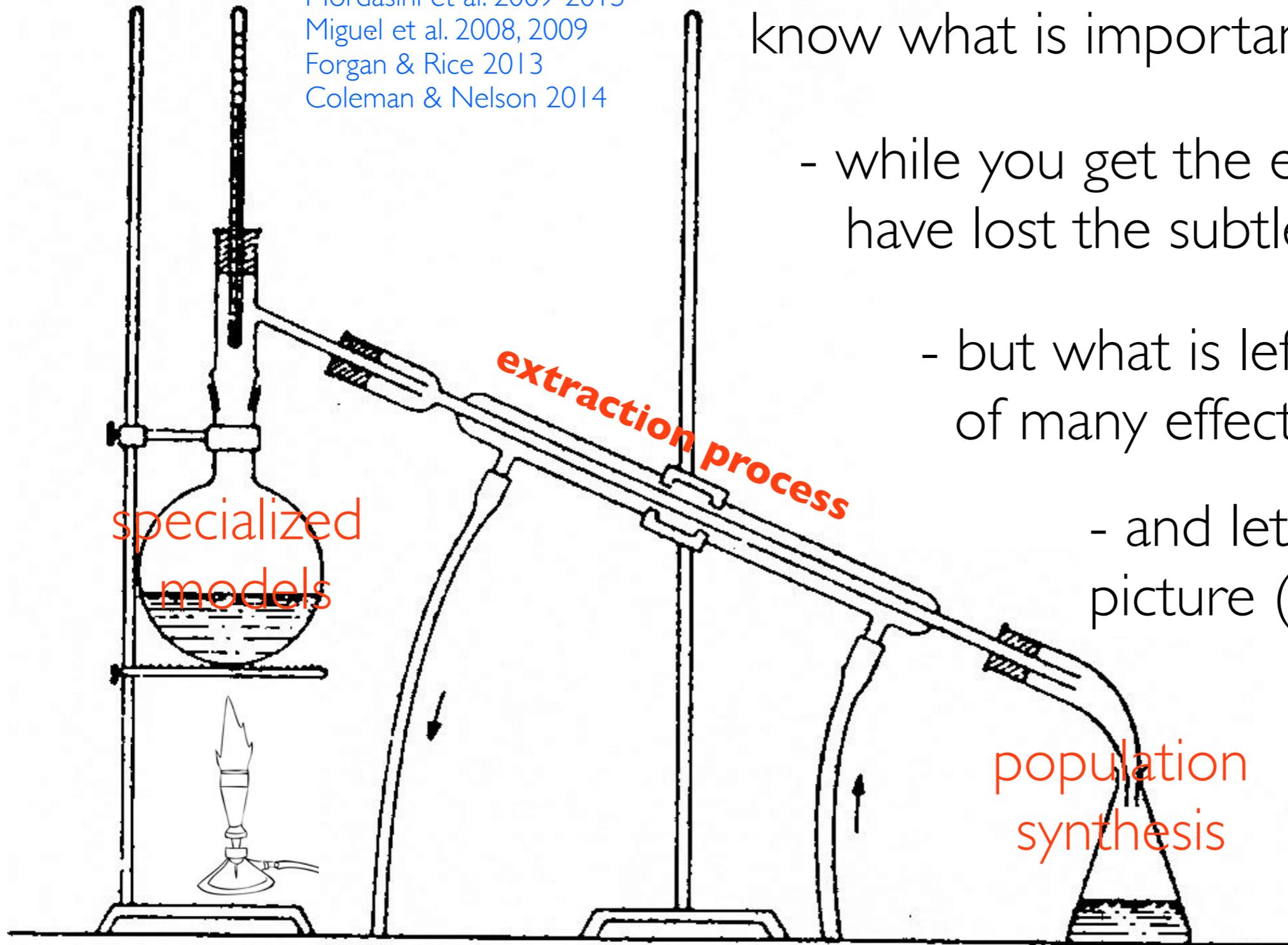
Essence of the method: a global model of planet formation and evolution, combining simplified descriptions of the essential physical mechanisms.



# The essence of the method

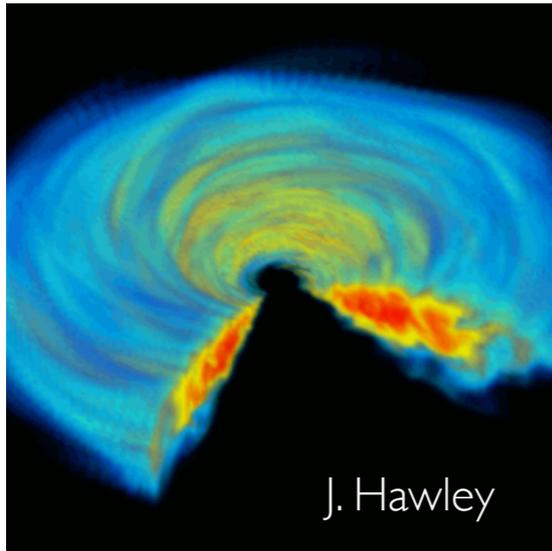
Ida & Lin 2004-2013  
Thomes et al. 2008  
Mordasini et al. 2009-2015  
Miguel et al. 2008, 2009  
Forgan & Rice 2013  
Coleman & Nelson 2014

- you need specialized models to know what is important
- while you get the essence, you have lost the subtlety of the original
- but what is left is a concentrate of many effects
- and lets you see the big picture (hopefully)





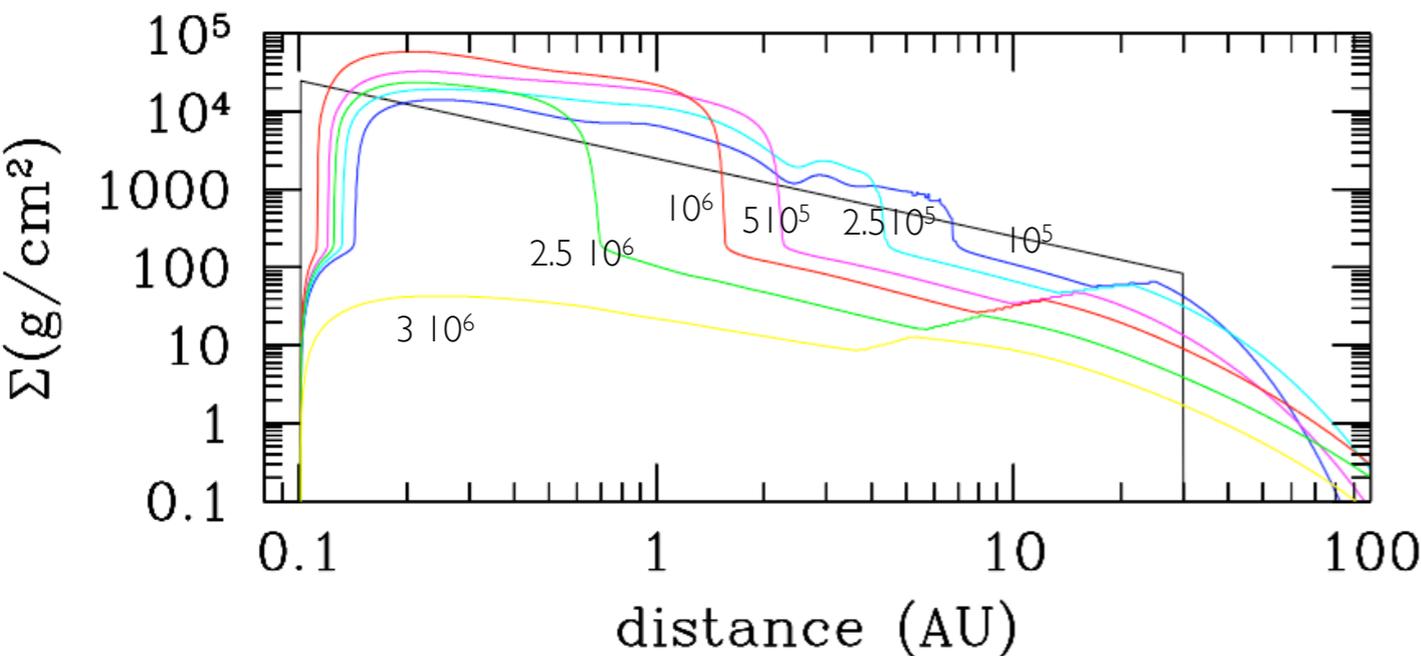
# Distill how strongly?



$$\frac{\partial \rho}{\partial t} + \nabla \cdot (\rho \mathbf{v}) = 0$$

$$\rho \frac{\partial \mathbf{v}}{\partial t} + (\rho \mathbf{v} \cdot \nabla) \mathbf{v} = -\nabla \left( P + \frac{B^2}{8\pi} \right) - \rho \nabla \Phi + \left( \frac{\mathbf{B}}{4\pi} \cdot \nabla \right) \mathbf{B} + \eta_V \left( \nabla^2 \mathbf{v} + \frac{1}{3} \nabla (\nabla \cdot \mathbf{v}) \right)$$

$$\frac{\partial \mathbf{B}}{\partial t} = \nabla \times (\mathbf{v} \times \mathbf{B} - \eta_B \nabla \times \mathbf{B})$$



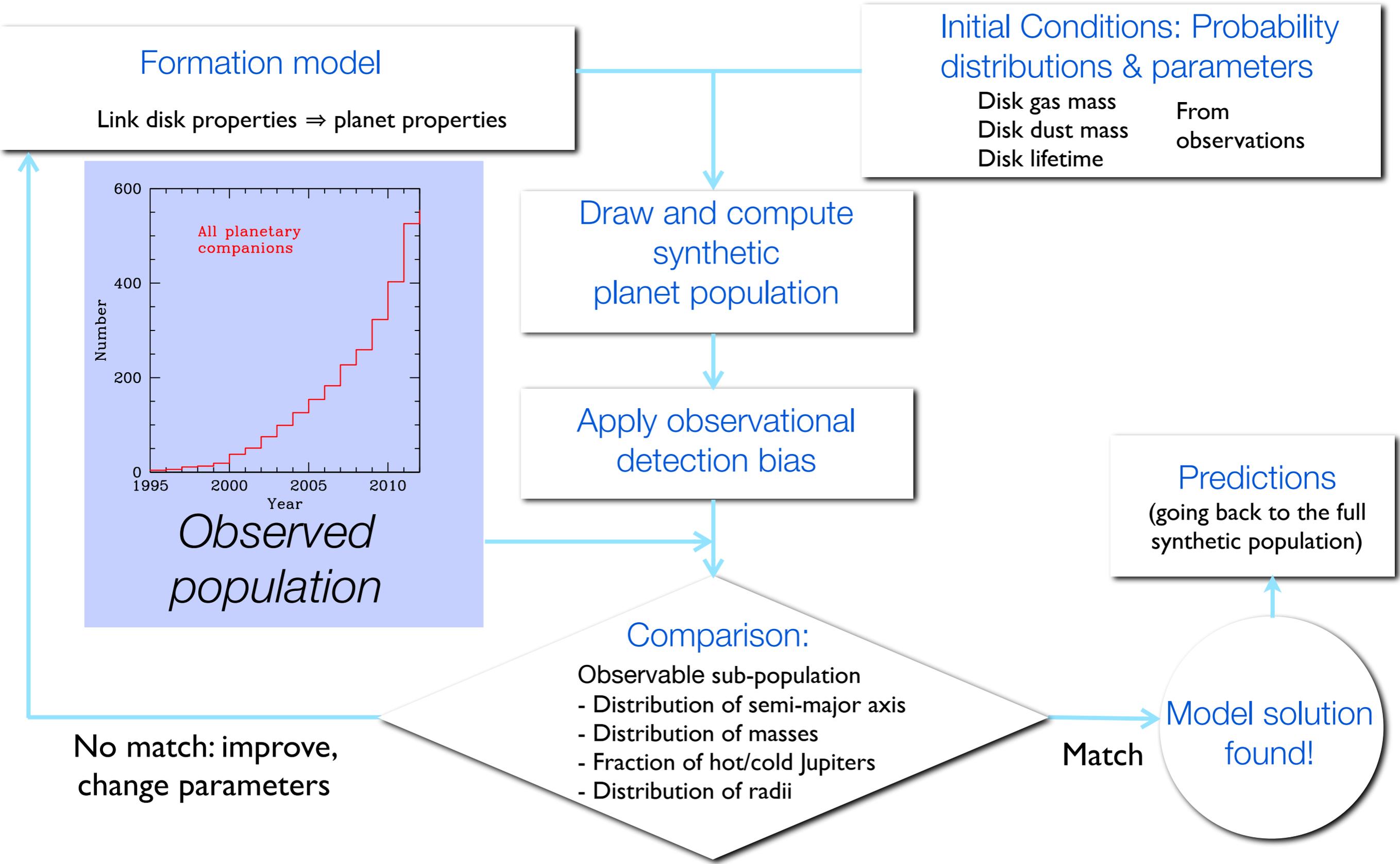
$$\frac{d\Sigma}{dt} = \frac{3}{r} \frac{\partial}{\partial r} \left[ r^{1/2} \frac{\partial}{\partial r} \tilde{v} \Sigma r^{1/2} \right] + \dot{\Sigma}_w(r)$$

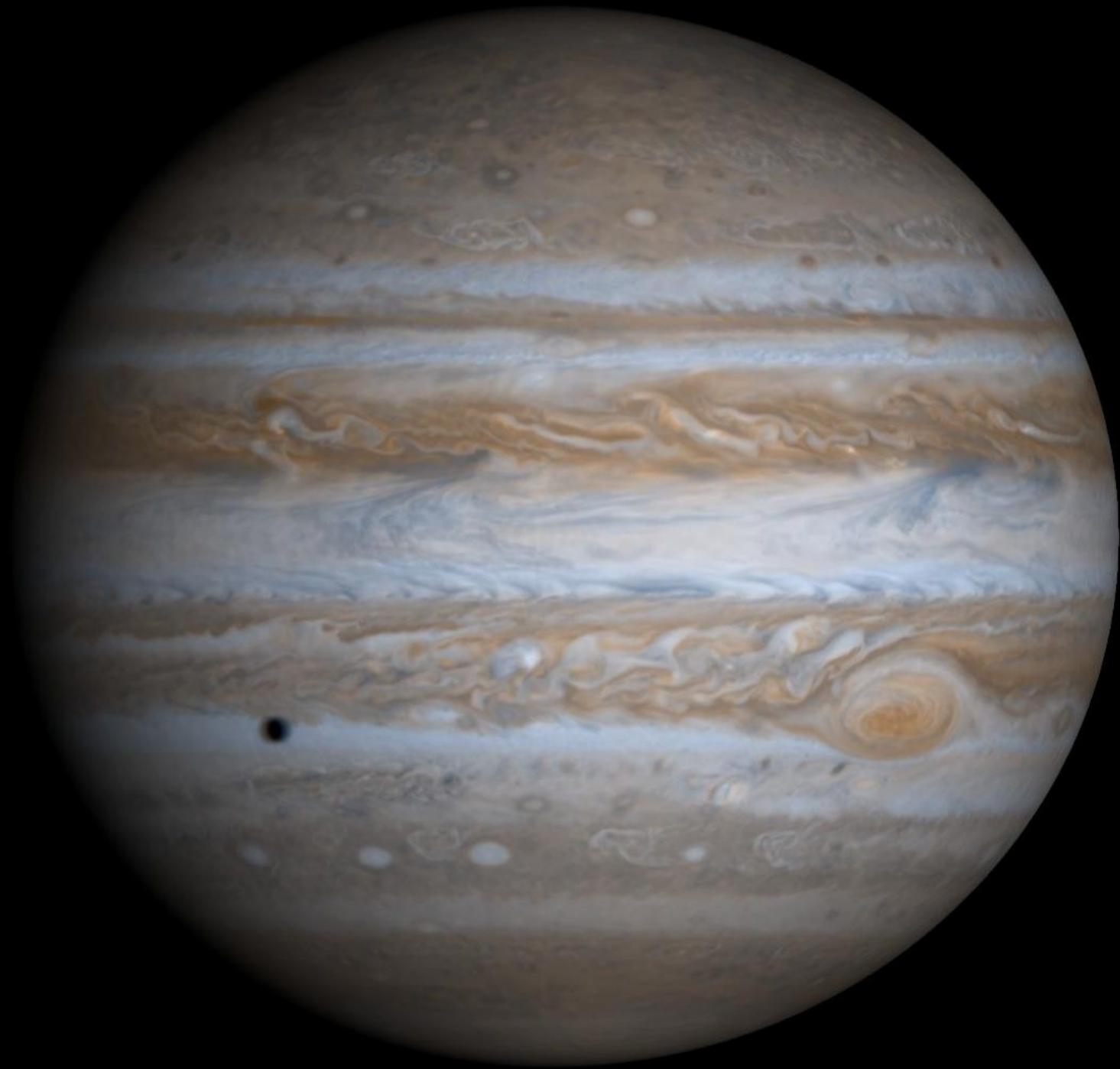
$$\Sigma(r) = \Sigma_0 \left( \frac{r}{r_0} \right)^{-\alpha} e^{-t/\tau}$$

How simple is still good enough?



# Population synthesis work flow





1.

Input physics



# *First modern model: Ida & Lin 2004*

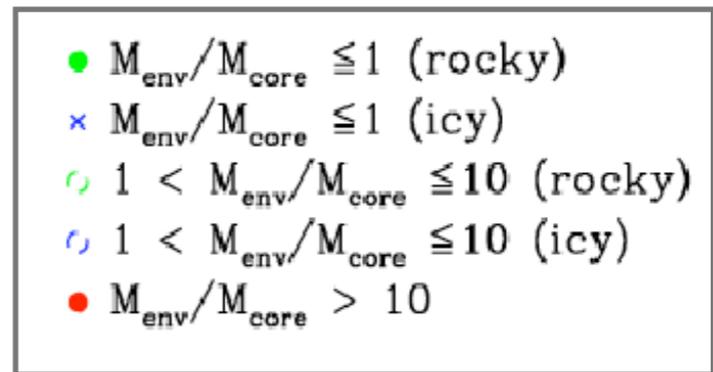
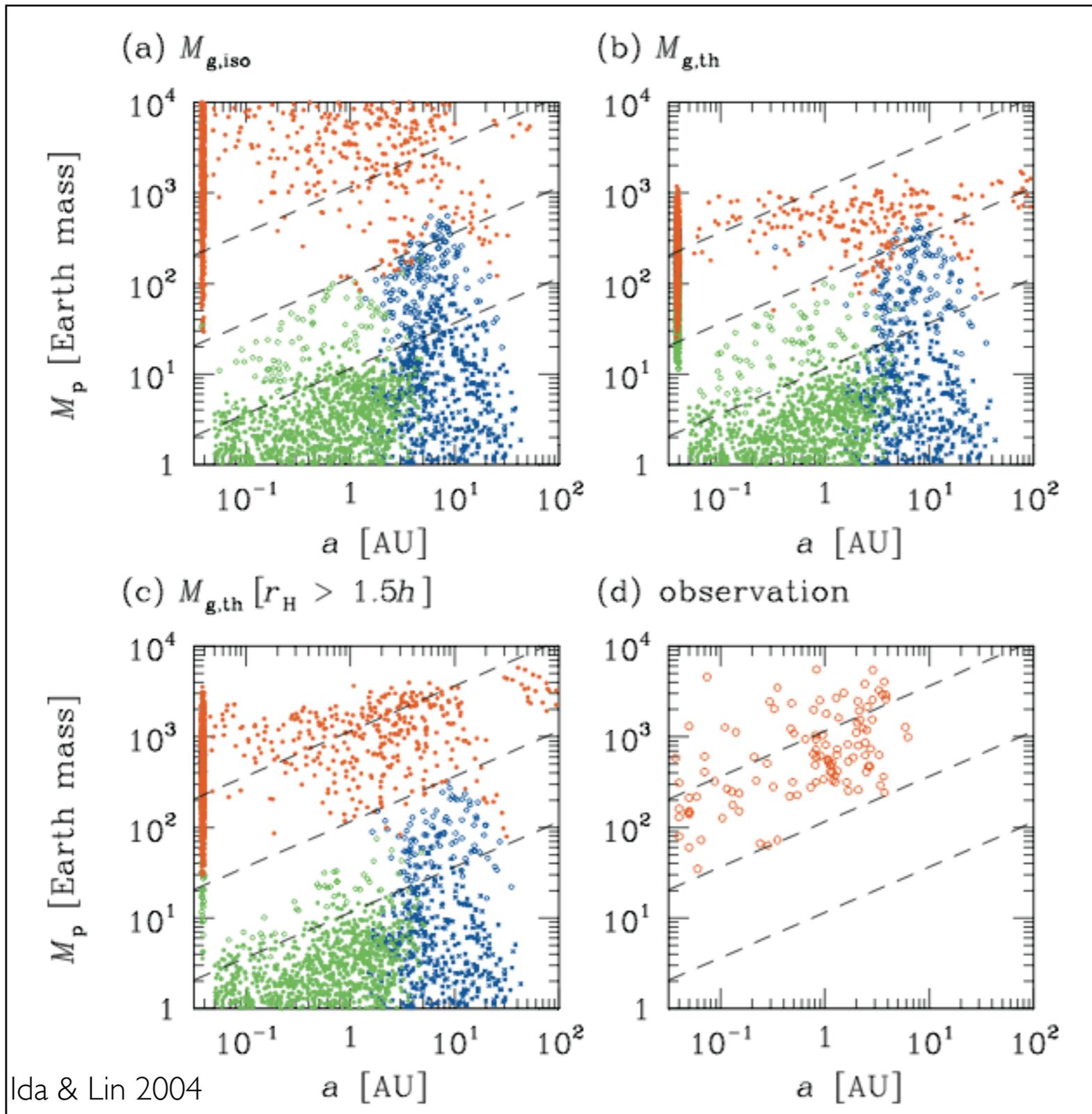
Ida & Lin (2004, 2005, 2008, 2010, 2013) building on Kokubo & Ida 2002, Ida & Makino 1993, ...

- \* **Disk model:** powerlaw, exponential decrease
- \* **Accretion of solids:** Safronov rate equation, isolation mass  
Safronov 1969, Greenzweig & Lissauer 1992, Ida & Makino 1993
- \* **Accretion of gas:** Parameterized KH-contraction, fitted  $M_{\text{crit}}$   
Perri & Cameron 1974, Mizuno et al. 1978, Ikoma et al. 2000
- \* **Termination of gas accretion:** Gap formation, disk dissipation  
Lubow 1999, Kley & Dirksen 2006
- \* **Coalescence of embryos:** 1 embryo per disk, later semi-analytical prescription (orbit crossing)
- \* **Orbits:** type I and II disk migration  
Goldreich & Tremaine 1979, Lin & Papaloizou 1986, Paardekooper et al. 2010, ...
- \* **Monte Carlo variables:** position of embryo, disk mass, dust-to-gas ratio, disk lifetime

Later several improvements: dead zones, local enhancement of solids, ...

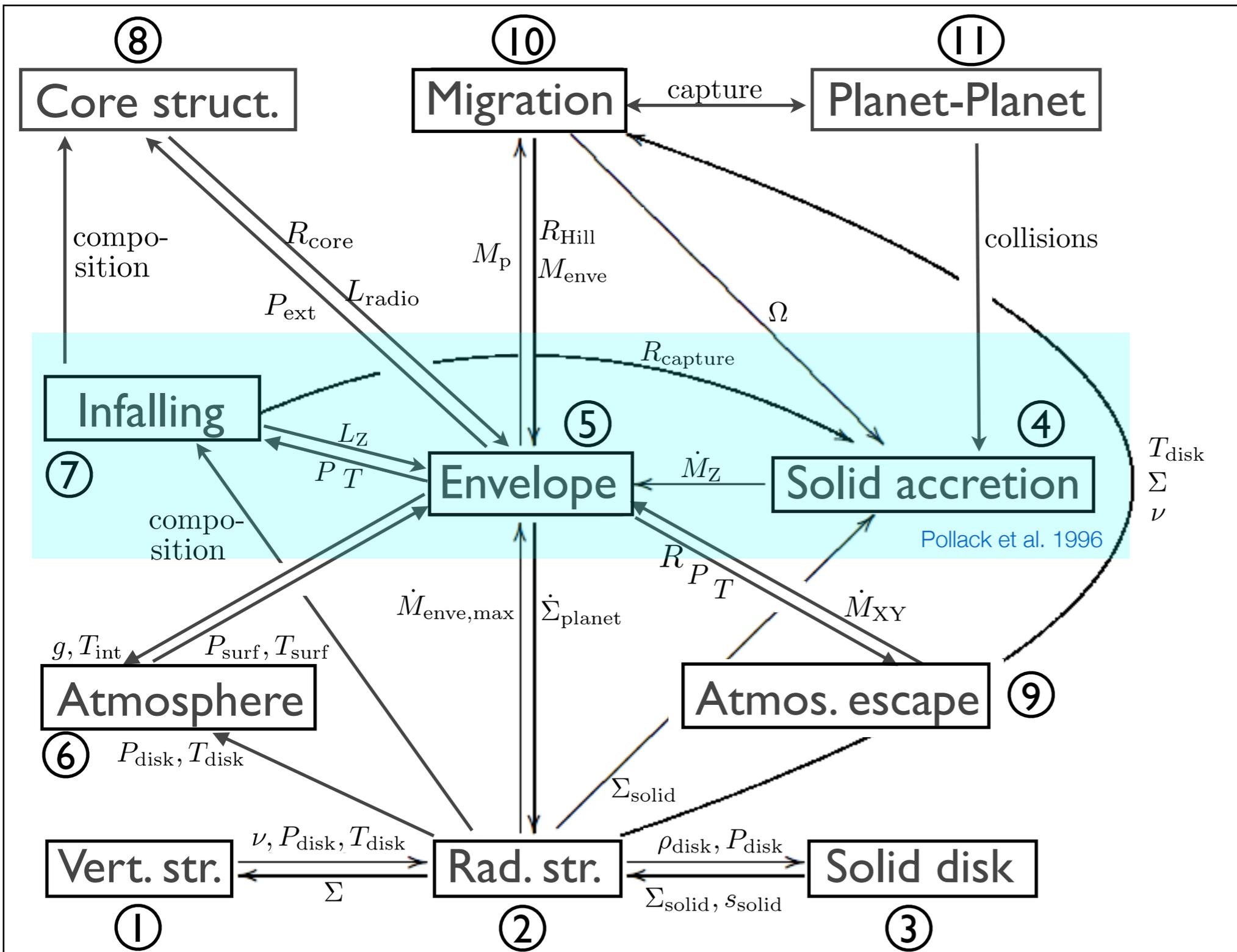


# First modern pop. synthesis



- aM: diversity
- Planetary desert
- Metallicity effect (correlation between metallicity and giant planet detection probability)
- termination of gas accretion
- effects of type II migration

# Global formation & evolution model



Core accretion paradigm  
 protoplanetary disk evolution + Planet model (gas & solid accretion, interior structure)  
 + Disk migration (non-isothermal type I & type II)  
 + N-body

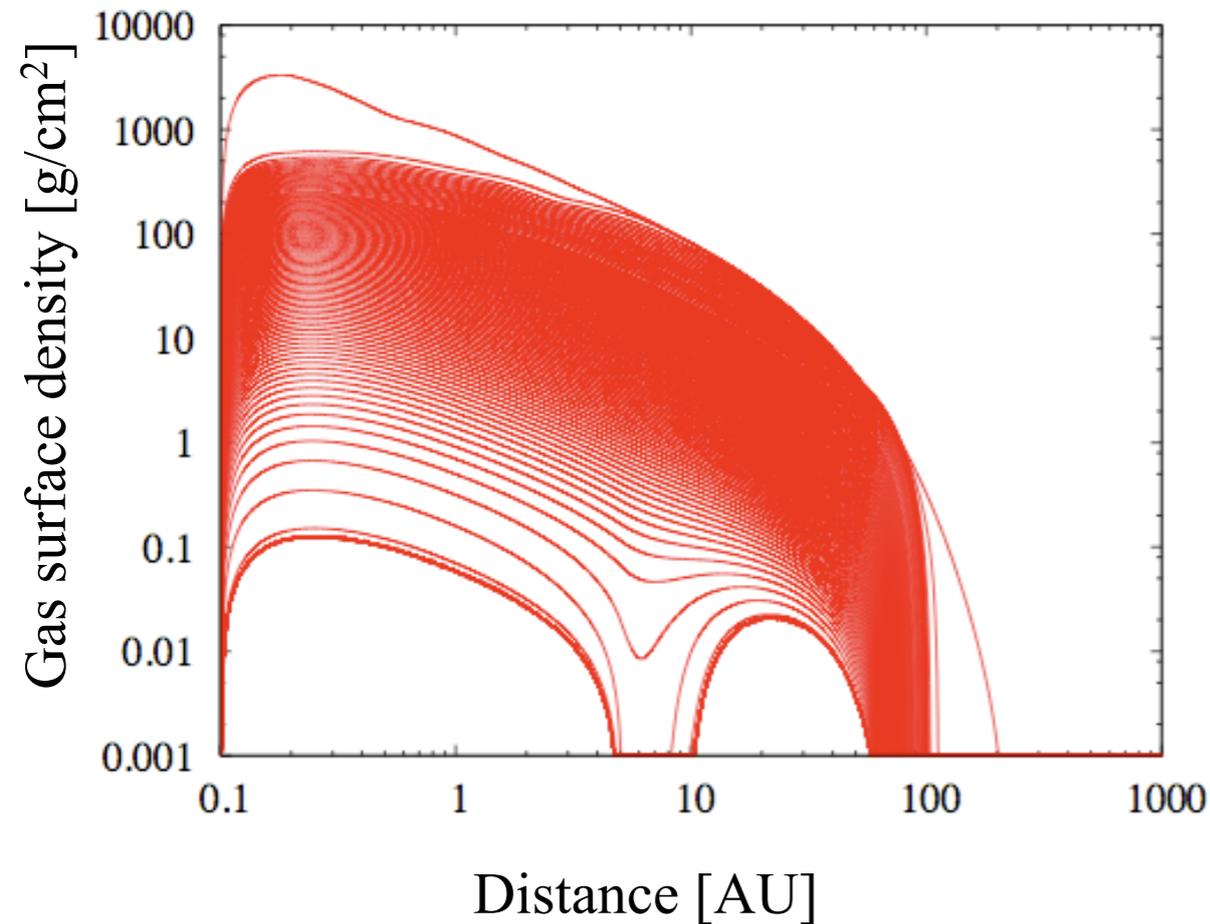
*Simple standard models, but coupled*



# $I + I D \propto$ disk model

## Evolution of the gas surface density

Lyden-Bell & Pringle 1974



$$\frac{d\Sigma}{dt} = \underbrace{\frac{3}{r} \frac{\partial}{\partial r} \left[ r^{1/2} \frac{\partial}{\partial r} \tilde{\nu} \Sigma r^{1/2} \right]}_{\text{Viscosity}} + \underbrace{\dot{\Sigma}_w(r)}_{\text{Photoevaporation}} + \underbrace{\dot{Q}_{\text{planet}}(r)}_{\text{Planet accretion}}$$

Vertical & radial structure.

Shakura & Sunyaev 1973  
Chiang & Goldreich 1997

- constant  $\alpha$   $\nu = \alpha c_s H$
- stellar irradiation included for temperature

- external photoevaporation

Matsuyama et al. 2003

$$\dot{\Sigma}_{w,\text{ext}} = \begin{cases} 0 & \text{for } r < \beta R_{g,I} \\ \frac{\dot{M}_{\text{wind,ext}}}{\pi(r_{\text{max}}^2 - \beta^2 R_{g,I}^2)} & \text{otherwise} \end{cases}$$

- internal photoevaporation

Clarke et al. 2001

$$\dot{\Sigma}_{w,\text{int}} = \begin{cases} 0 & \text{for } r < R_{\text{wind}} \\ 2c_{s,II} n_0(r) u_{\text{ma}} & \text{otherwise} \end{cases}$$

- gas accreted by planet taken from feeding zone

$$a_{\text{planet}} \pm 0.5 \times R_H \quad \dot{Q}_{\text{planet}} = -\dot{M}_{XY}$$

Initial surface density profile: [Andrews et al. 2009](#)

$$\Sigma(r, t = 0) = \Sigma_0 \left( \frac{r}{R_0} \right)^{-\gamma} \exp \left[ - \left( \frac{r}{R_c} \right)^{2-\gamma} \right]$$

Inner disk edge: 0.1 AU (arbitrary)

Outer disk edge: free



# Planet solid accretion rate

**Collisional** growth of one big body from small background planetesimals

-Simple Safronov type rate equation for growth of planet's core

$$\frac{dM_Z}{dt} = \Omega \Sigma_p \pi R_{capt}^2 F_G(e, i)$$

- $F_G(e, i)$  3 Body gravitational focussing factor from Greenzweig & Lissauer 1992

- $R_{capt}$ : Capture radius (envelope effect)  $> R_{core}$

-**Random velocity**  $\sigma(e, i)$  of planetesimals is key parameter (runaway, oligarchic, orderly)

-original model: (low) random velocities from Pollack et al. 1996

-updated model (Fortier et al. 2011): equilibrium stirring-gas damping (oligarchic regime)

**Ejection** of planetesimals by (massive) protoplanets

Ida & Lin 2004

$$\frac{\text{accretion rate}}{\text{ejection rate}} = \left( \frac{V_{\text{esc,disk}}}{V_{\text{surf,planet}}} \right)^4$$

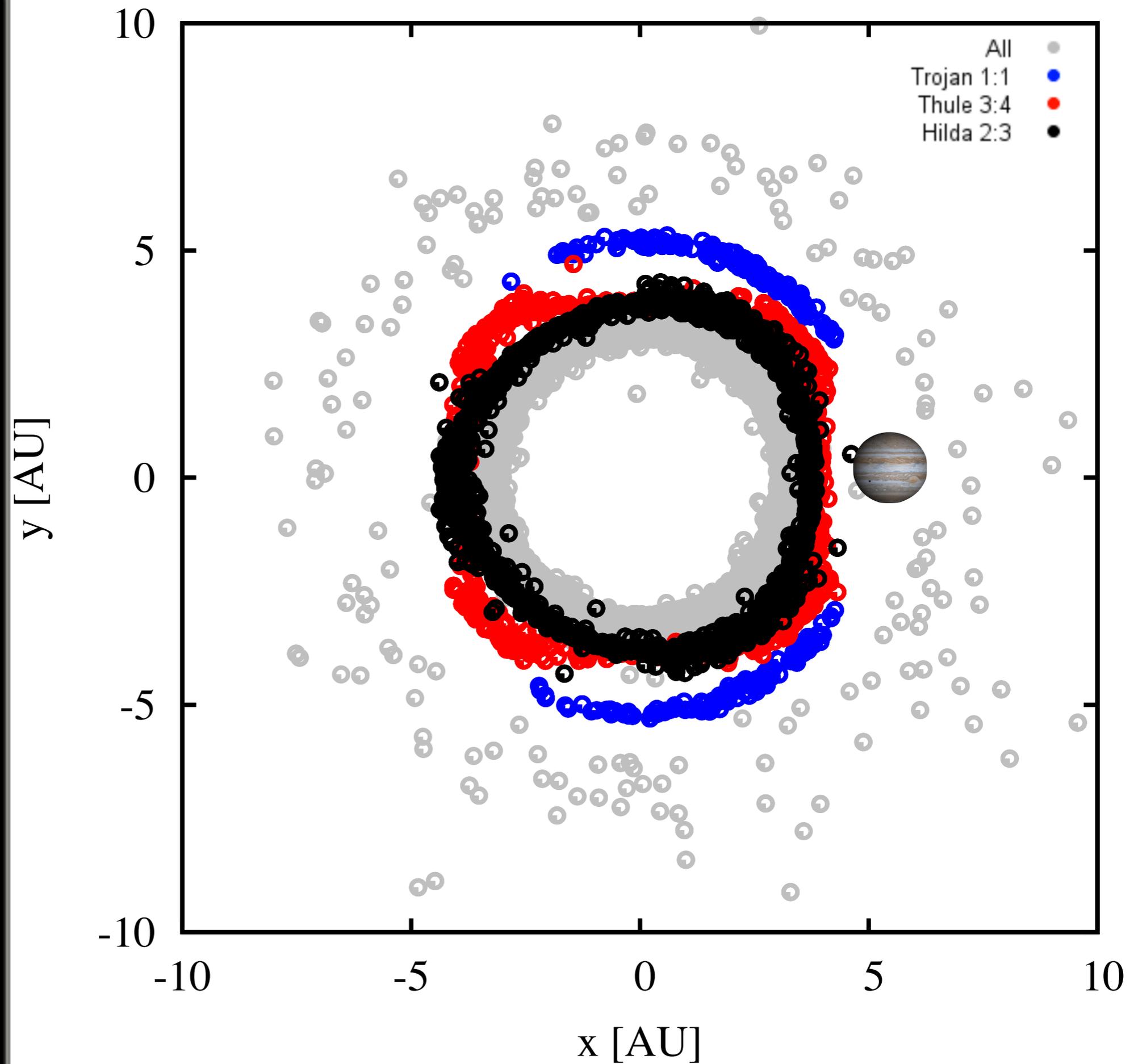
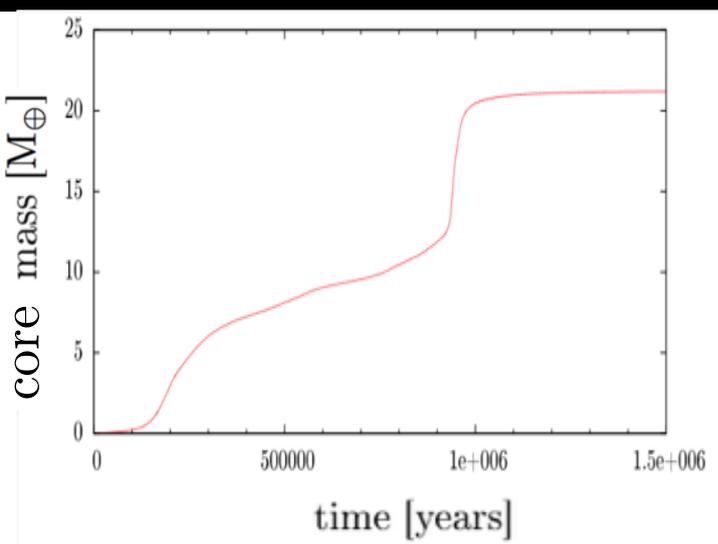
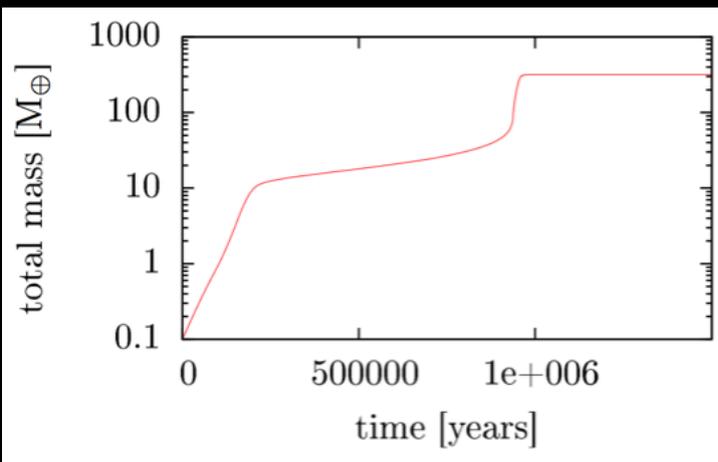
$$V_{\text{esc,disk}} = \sqrt{2GM_{\odot}/a_{\text{planet}}}$$

$$V_{\text{surf,planet}} = \sqrt{GM_{\text{planet}}/R_c}$$

Pebbles: work in progress

## N-Body simulation

- Star, planetesimal swarm & growing planet at 5.2 AU
- Corrotating coord. system
- Planet also accretes gas
- Rapid gas accretion at about 0.9 Myr





# Planet gas envelope structure

1-D radial **structure** equations (similar to **stellar** structure)

e.g. Bodenheimer & Pollack 1986

$$\frac{dm}{dr} = 4\pi r^2 \rho \qquad \frac{dP}{dr} = -\frac{Gm}{r^2} \rho$$

$$\frac{dl}{dr} = 4\pi r^2 \rho \left( \epsilon - T \frac{\partial S}{\partial t} \right) \qquad \frac{dT}{dr} = \frac{T}{P} \frac{dP}{dr} \nabla$$

Mass conservation  
 Hydrostat. equilibrium  
 Energy conservation  
 Energy transport

Additional energy source:  
 -impacting planetesimals  
 -deuterium burning  
 -radiogenic heating

$$\nabla = \frac{d \ln T}{d \ln P} = \min(\nabla_{\text{ad}}, \nabla_{\text{rad}}) \qquad \nabla_{\text{rad}} = \frac{3}{64\pi\sigma G} \frac{\kappa l P}{T^4 m}$$

Gas accretion rate given by ability to **radiate away energy** ( $T_{KH}$ )

Gas accretion rate in runaway/detached phase ( $M_{\text{core}} > \sim 10 M_E$ )

**Accretion** rate in the **disk**

(flow of gas usually towards the star)

$$\dot{M}_{\text{disk}} = 3\pi \tilde{\nu} \Sigma + 6\pi r \frac{\partial \tilde{\nu} \Sigma}{\partial r}$$

Planet **cannot accrete more** than disk gives

$$\frac{dM_{XY}}{dt} = \text{Min} \left[ \frac{dM_{\text{struct}}}{dt}, k_{\text{Lub}} \dot{M}_{\text{disk}} \right]$$

Local reservoir can be accreted at Bondi rate

No external cut-off



# Envelope structure: boundary conditions

## 1. Attached phase

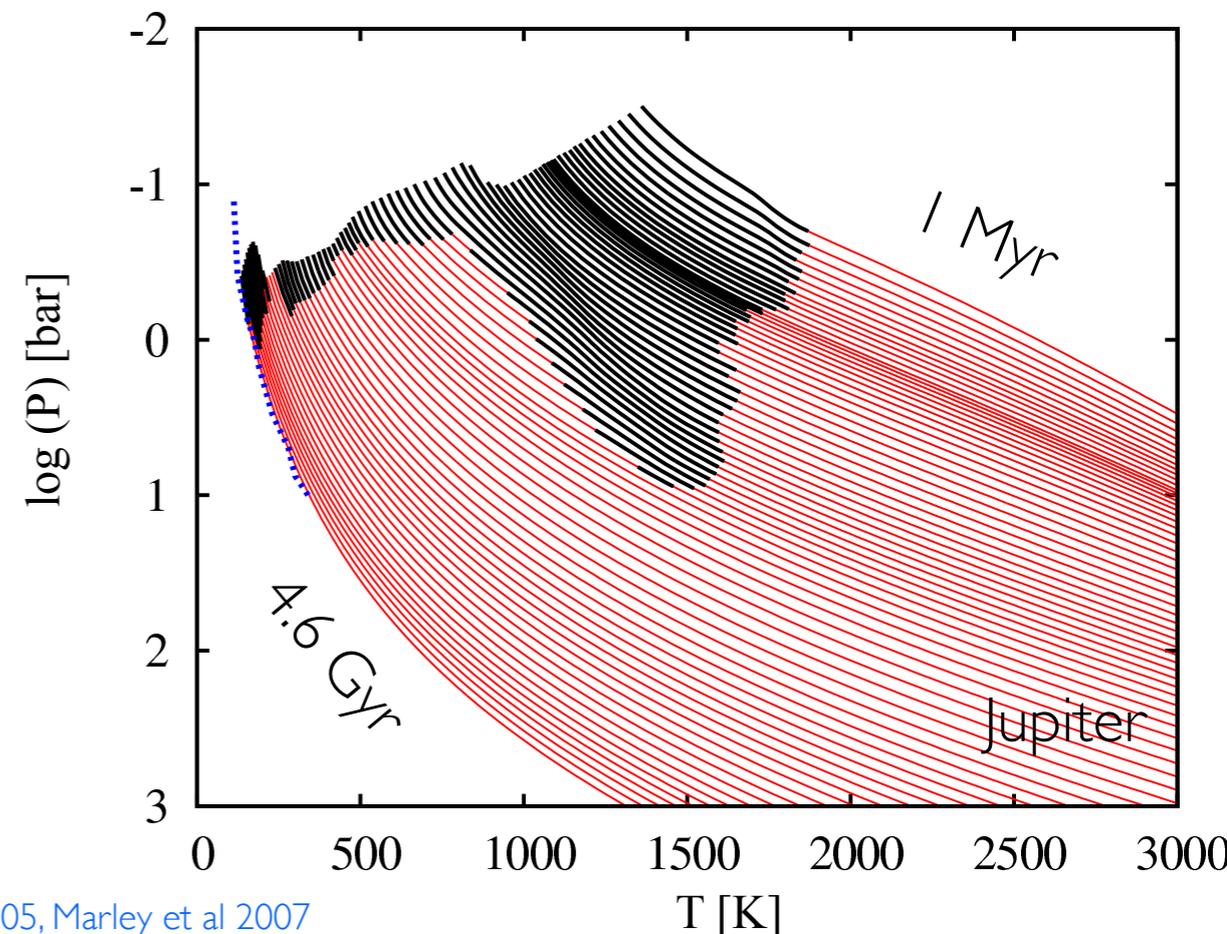
- low mass planets ( $M_{\text{core}} < \text{ca. } 10\text{-}20 M_{\text{Earth}}$ )
- pre gas runaway accretion
- structure goes smoothly to Hill or accretion radius
- boundary conditions: background nebula

## 2. Detached phase

- gas runaway accretion (high mass planets)
- structure has a free outer radius
- rapid collapse of radius from  $R_{\text{Hills}}$  to  $\sim 2 R_{\text{J}}$
- upper boundary: accretion shock

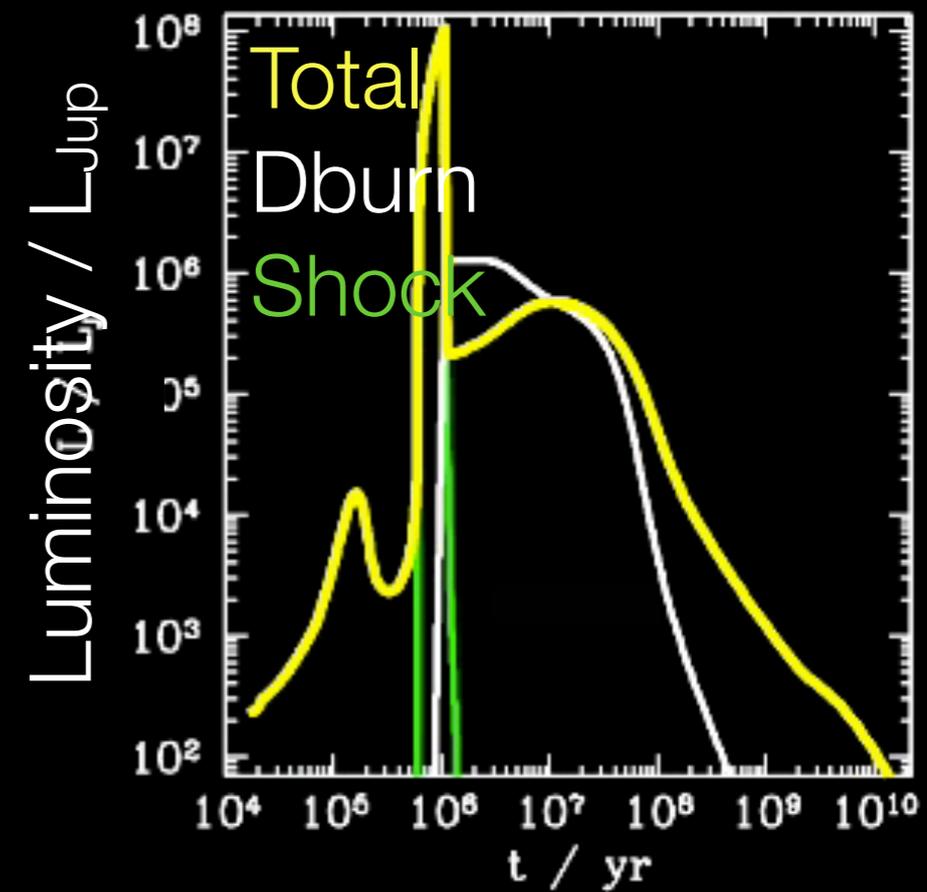
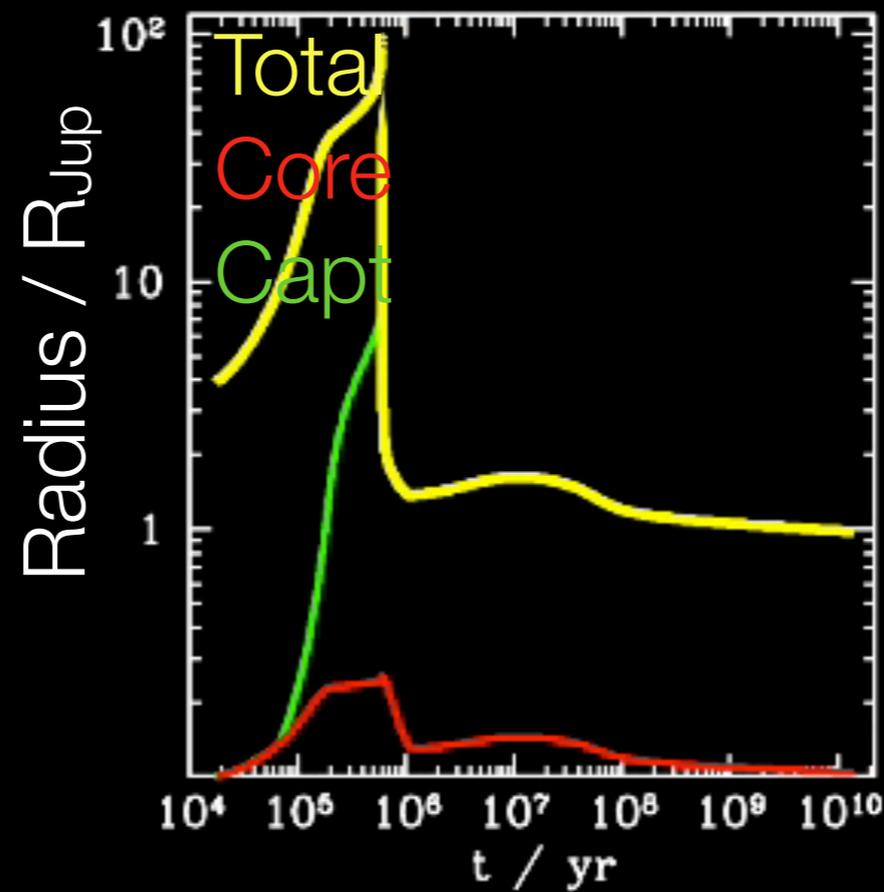
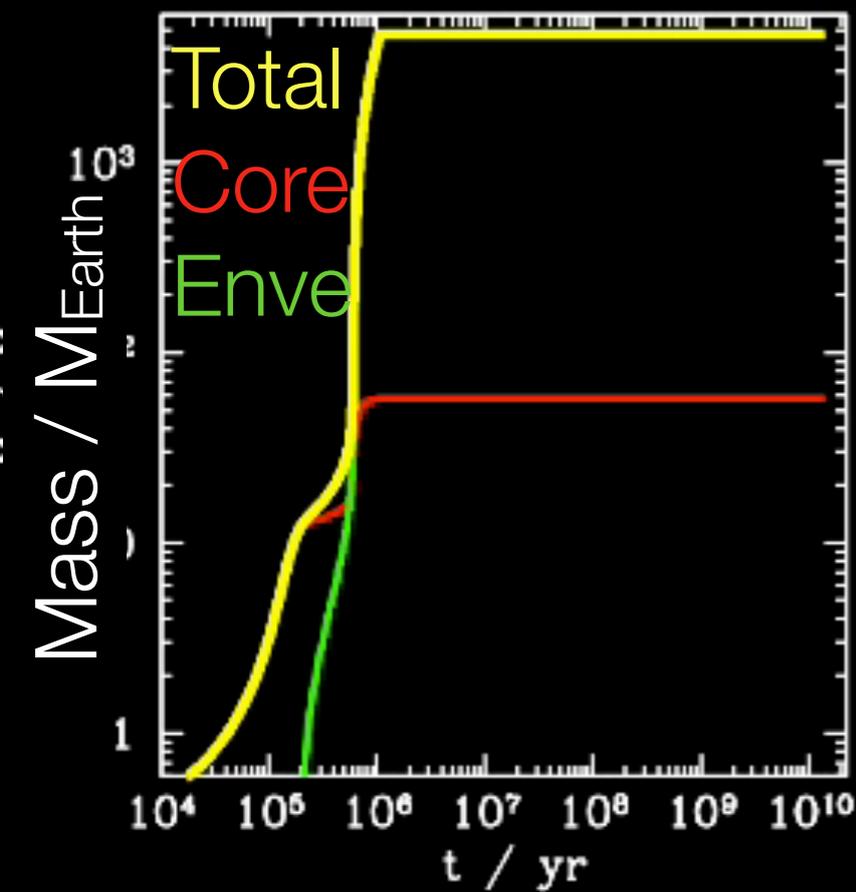
## 3. Thermodynamic evolution $M = \text{cst}$

- Eddington approximation (gray atmosphere)
- After disk dispersion



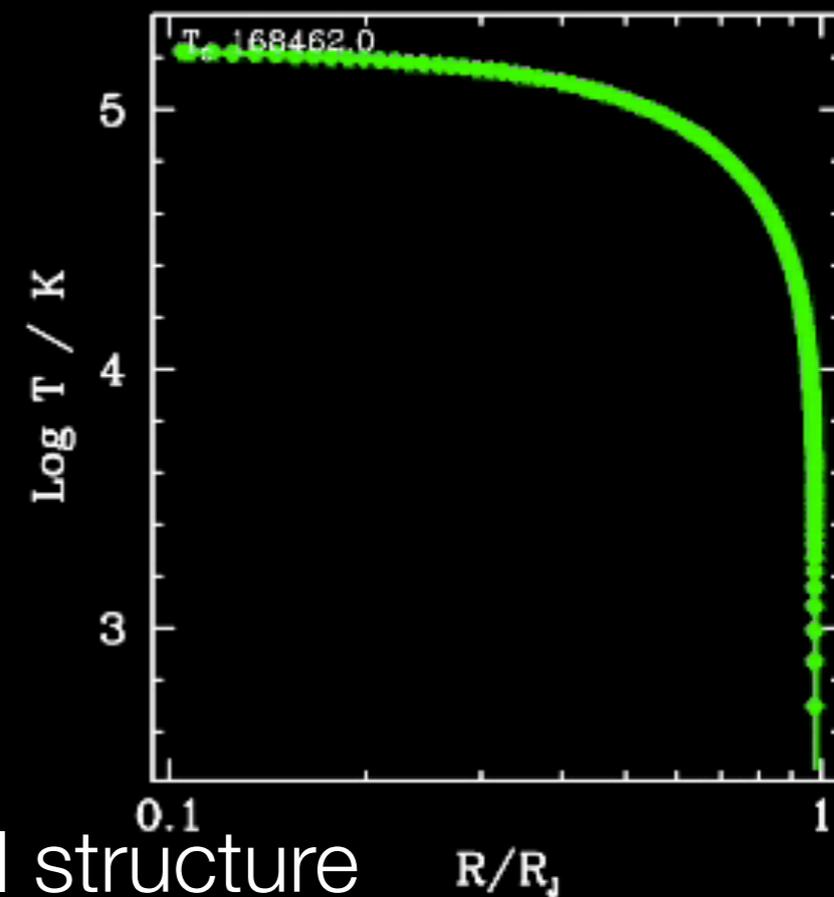
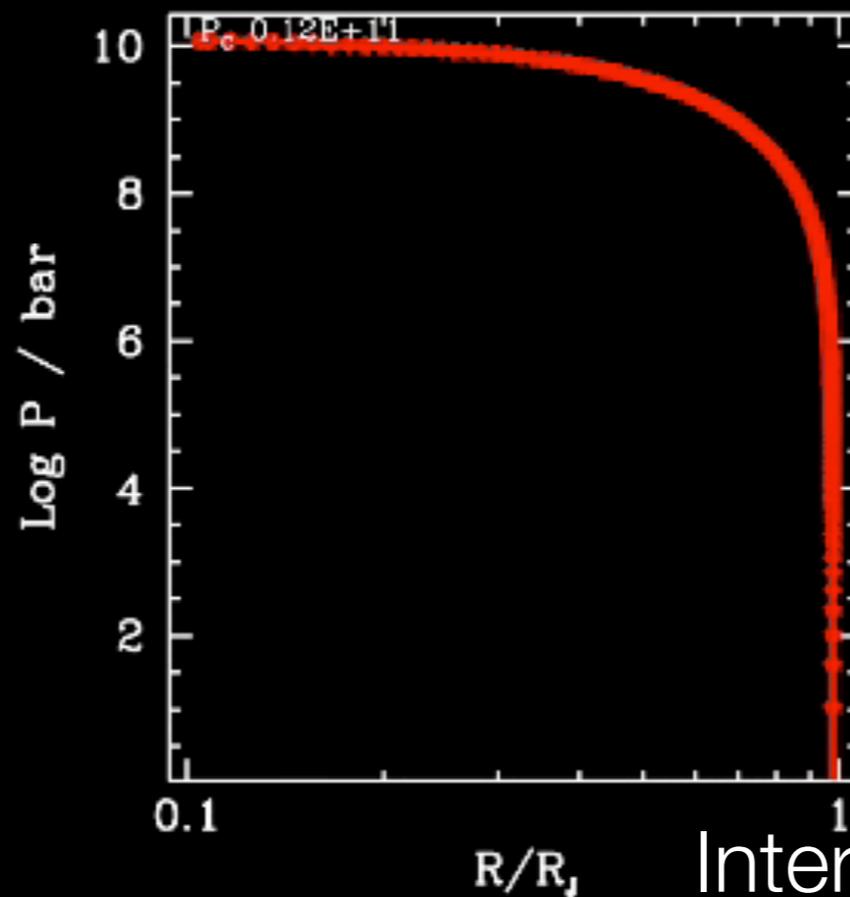
Time 1.39E+10 yrs

Temporal Evolution

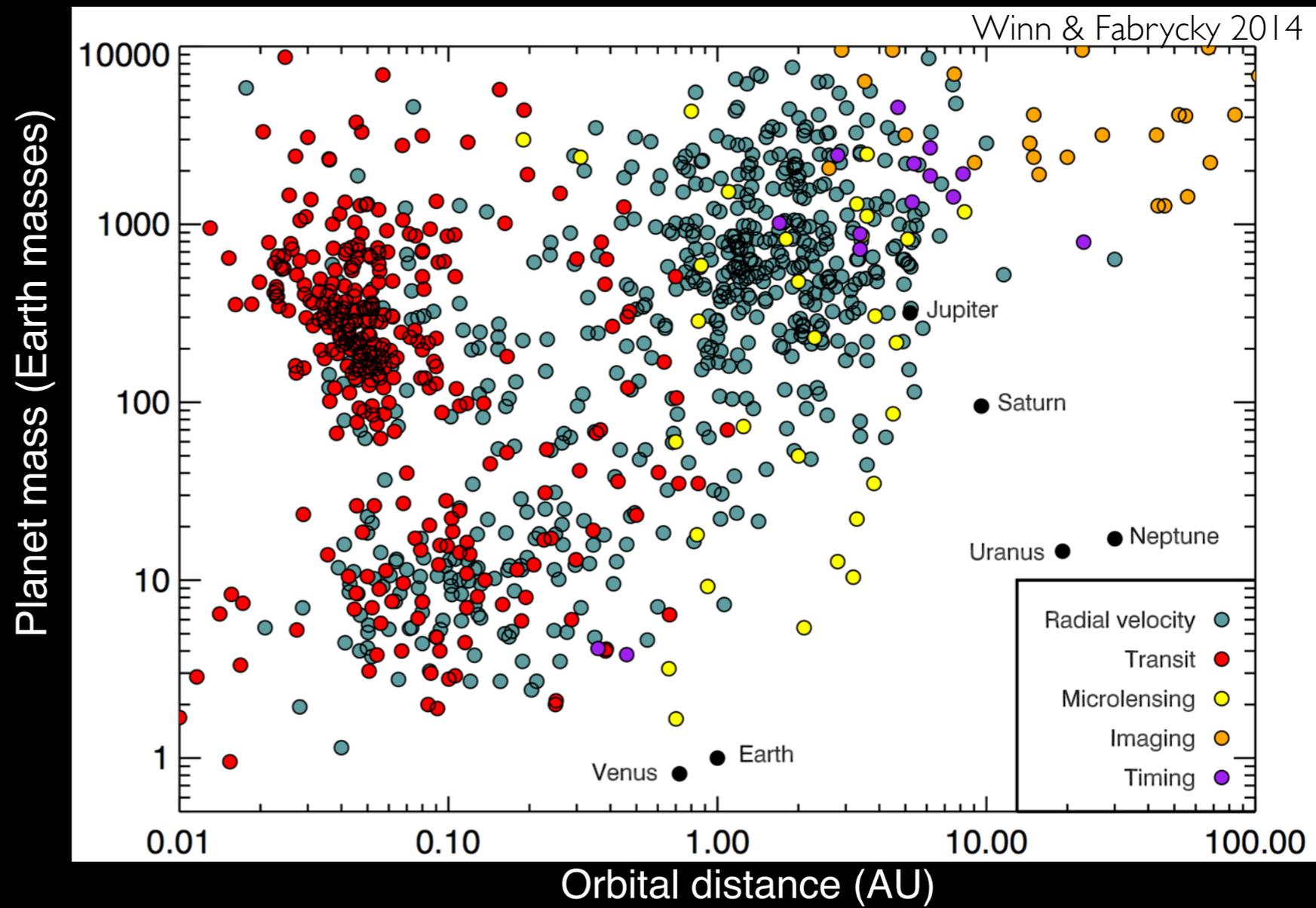


## Numerical Data

$M_{\text{tot}} / M_{\oplus}$	4753.655
$M_{\text{core}} / M_{\oplus}$	57.746
$M_{\text{env}} / M_{\oplus}$	4695.909
$R / R_j$	0.98
$L / L_j$	6.82E+01



Internal structure



3.

Statistical results on masses



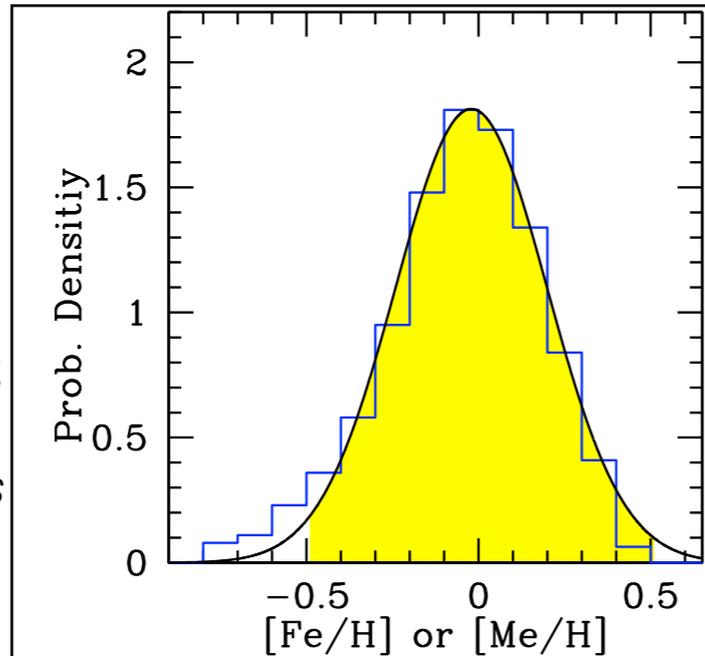
# 3 Monte Carlo initial conditions

Mordasini et al. 2009

## 1 Metallicity

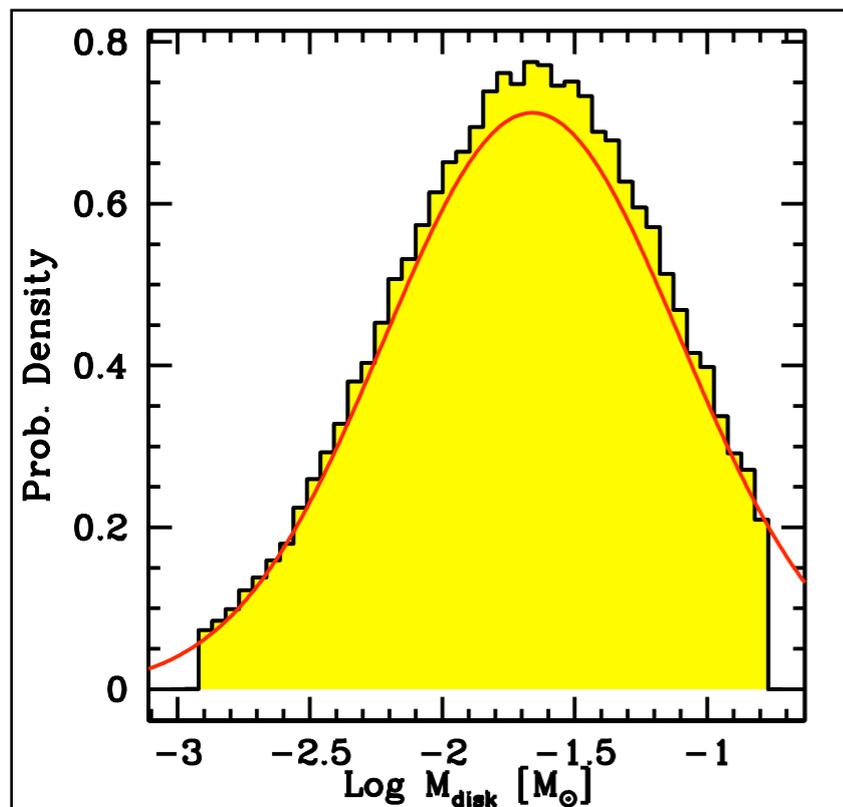
assume same in star and disk

Stellar  $[Fe/H]$  from spectroscopy. Gaussian distribution for  $[Fe/H]$  with  $\mu \sim 0.0$ ,  $\sigma \sim 0.2$ . (e.g. Santos et al. 2003)



## 2 Disk (gas) masses

Thermal continuum emission from cold dust at mm and submm wavelengths (Ophiuchus nebula).

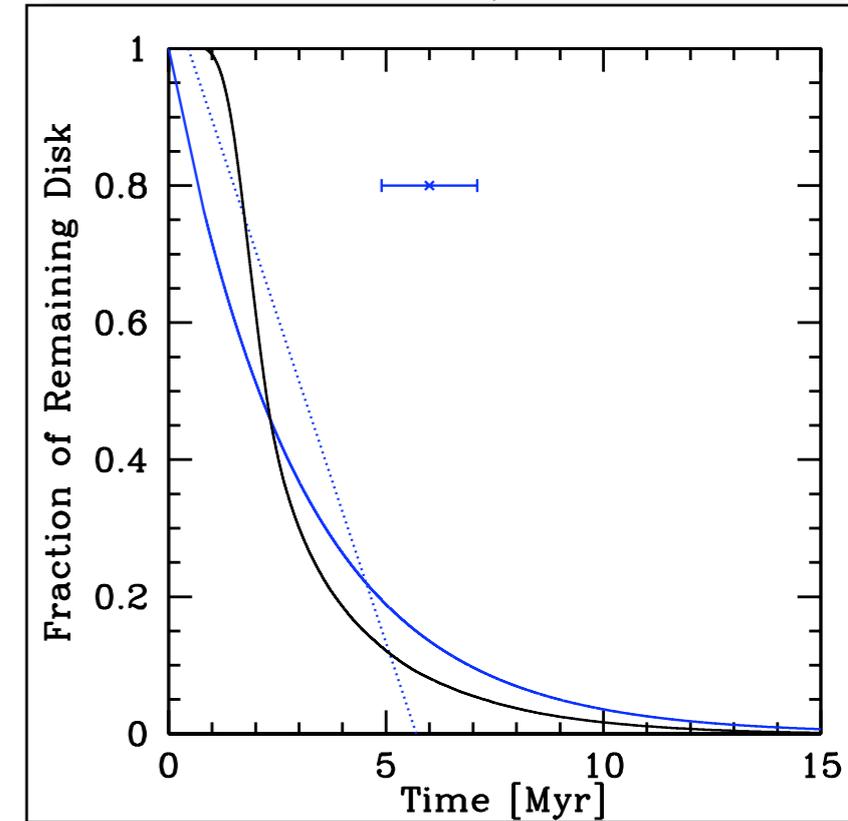


## 3 Disk lifetime

IR excess

vary lifetime via photoevaporation rate

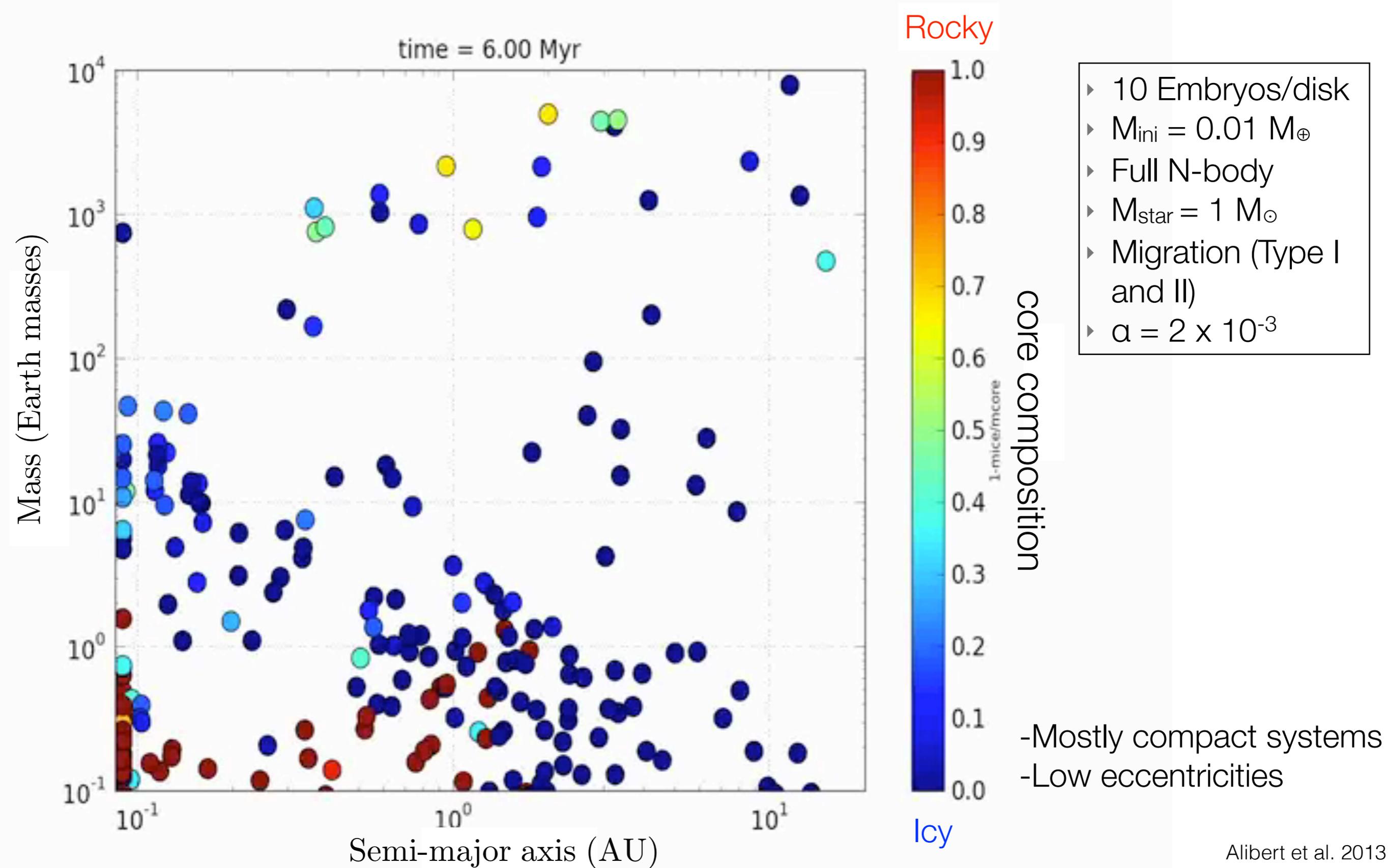
Haisch et al. 2001, Fedele et al. 2010



Draw initial conditions in Monte Carlo way to calculate synthetic population

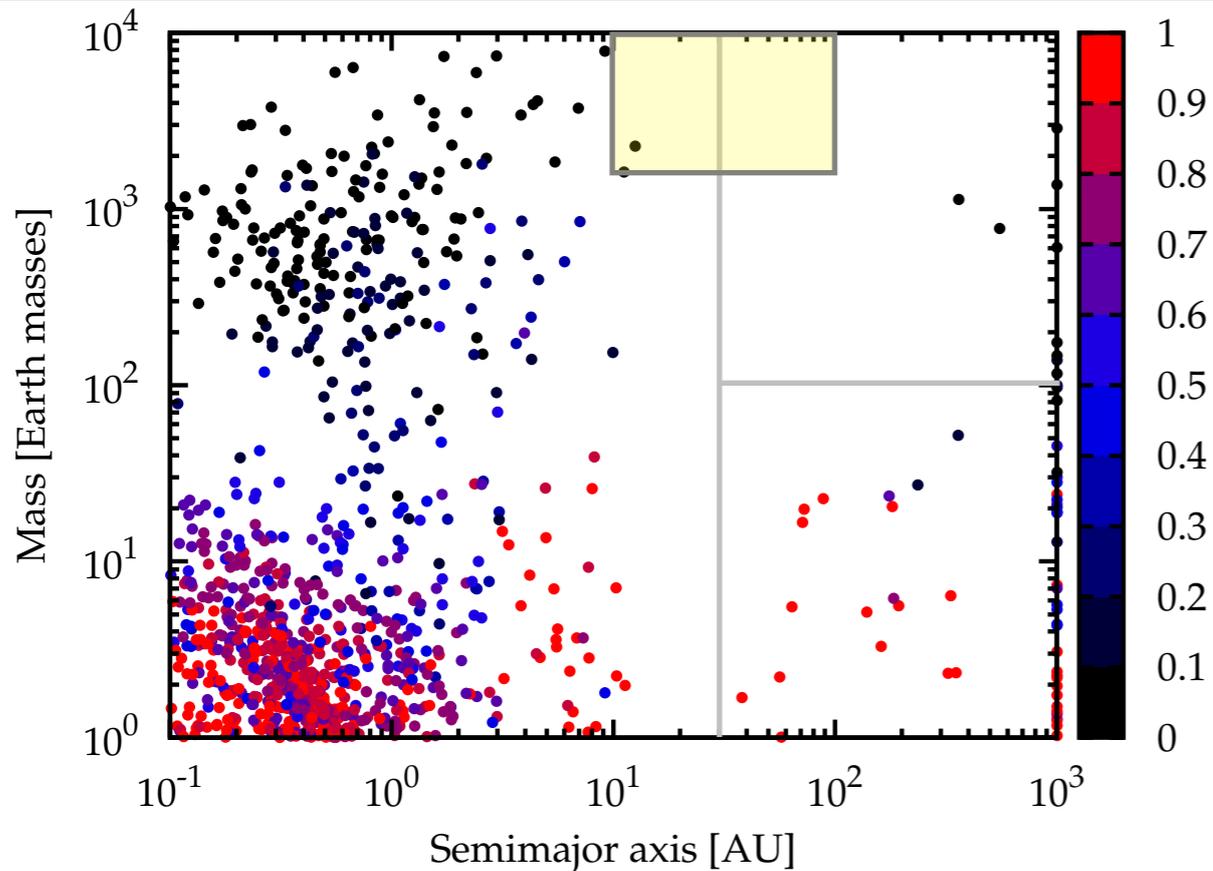


# Formation tracks





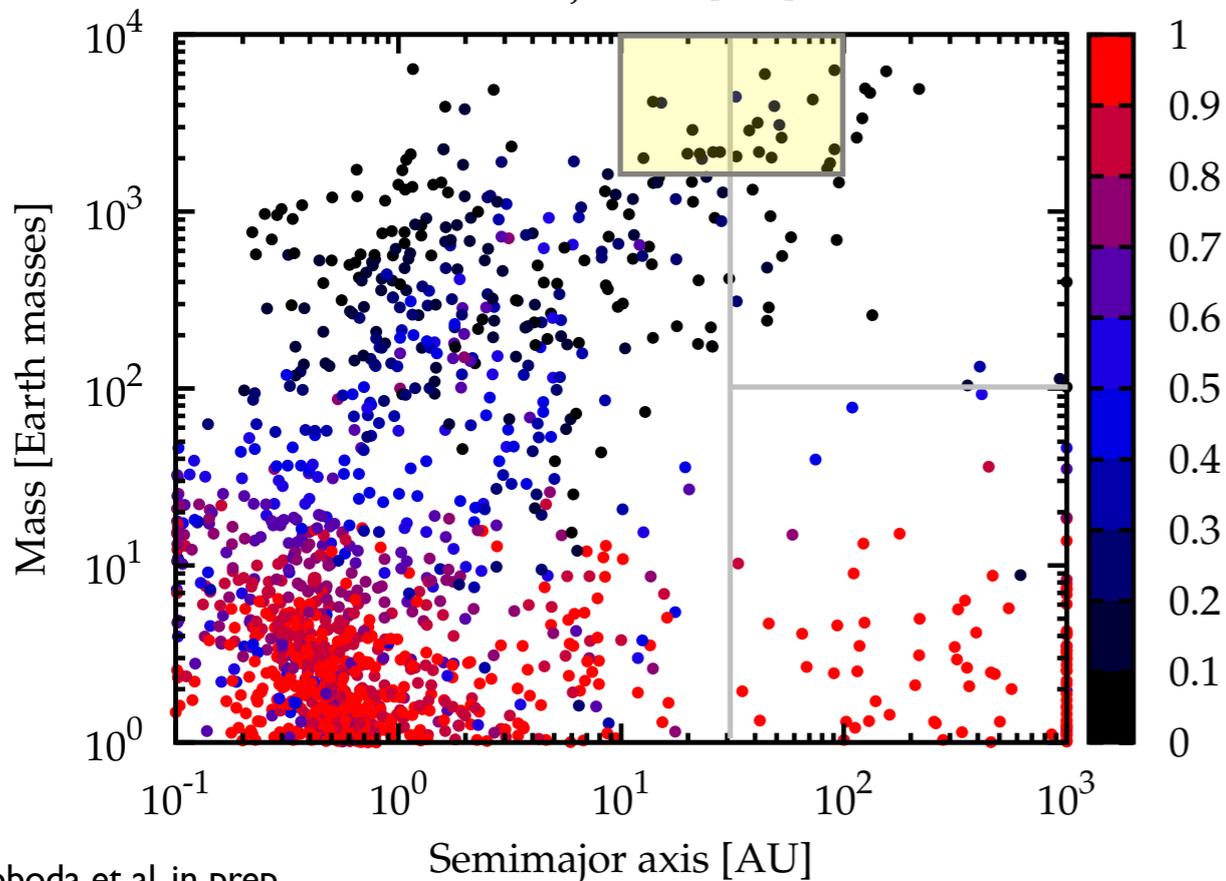
# Planets at large distances



## Fraction of stars with scattered or ejected planets ( $a > 30$ AU)

$\tau_{e,i} = 0.1 \tau_{\text{mig}}$  500 stars with 10 embryos

- \* 2 far giant planets 0.4 %
- \* 7 ejected giant planets 1.4 %
- \* 2 giants: frequency **0.4 %**
- \* 18 far low-mass planets 3.6 %
- \* 33 ejected low-mass planets 6.6 %



longer  $\tau_{e,i}$  659 stars with 10 embryos  
(Cresswell & Nelson 2008)

- \* 28 giant planets 5.36 %
- \* 2 ejected giant planets 0.5 %
- Brandt et al. 2014:
- 5-70 MJ
- \* 48 far low-mass planets 7.3 %
- 10-100 AU
- \* 46 ejected low-mass planets 7.0 %
- 1.0 - 3.1 %**

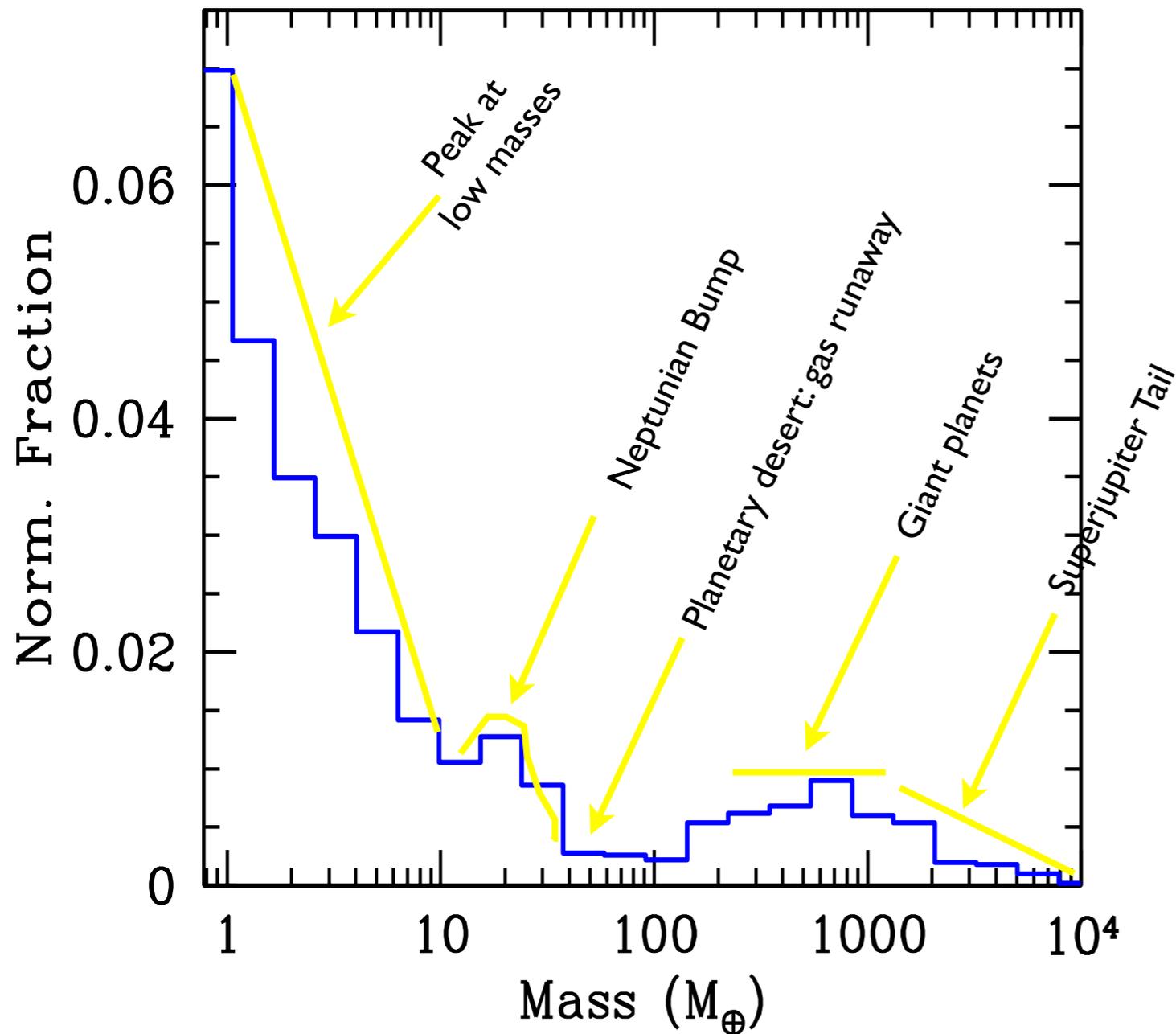
$M_{\text{star}} = 1 M_{\odot}$



# Planetary initial mass function

P-IMF

10 embryos/disk (full N-body), start mass:  $0.01 M_{\text{Earth}}$   
 $M_{\text{star}}=1M_{\odot}$ , full non-isothermal type I,  $\alpha=2 \times 10^{-3}$



Type	Mass (M)	% (of $M > 1 M$ )
(Super)-Earth	< 7	61
Neptunian	7-30	17
Intermediate	30-100	3
Jovian	100-1000	13
Super-Jupiter	> 1000	5

Planets with  $M < 30 M_{\text{Earth}}$  :  
 over 75% of all planets

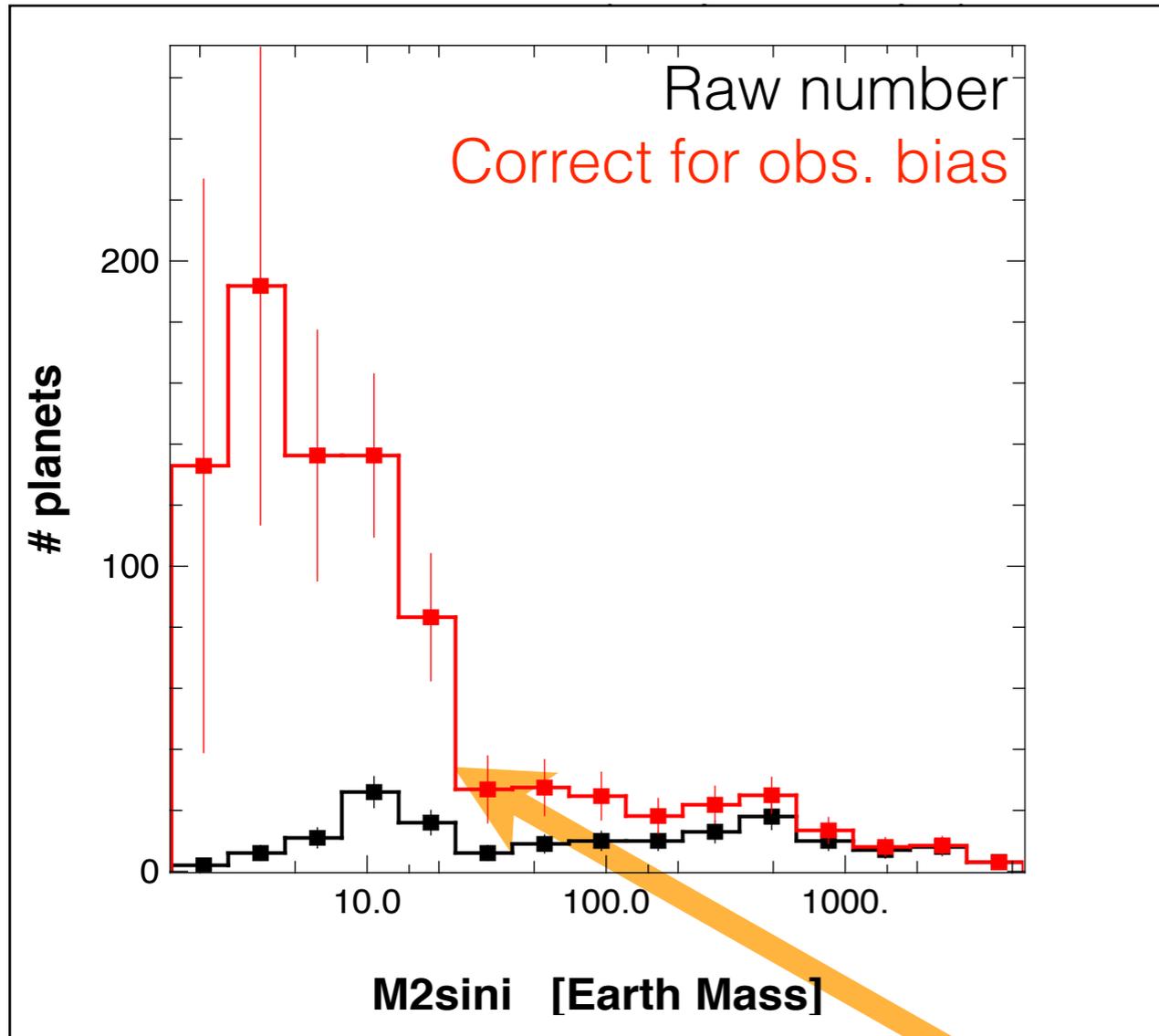
Giant planets = tip of the iceberg

- Complex structure, dominated by low mass planets
- Consistent w. non-detection of Jupiters around ~90% stars.



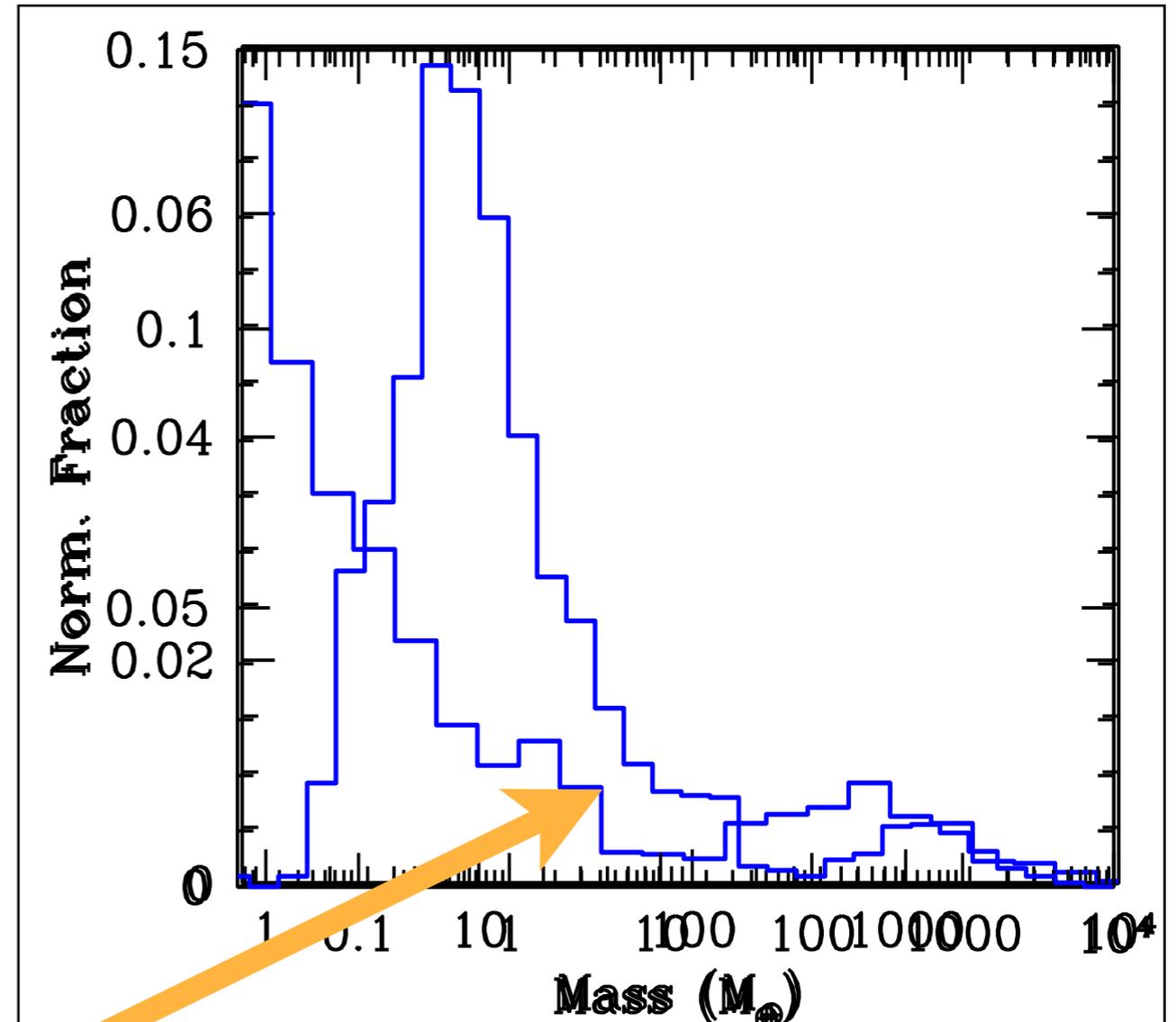
# Comparison with observations

Observations



Mayor et al. 2011

Synthetic



Benz et al. 2014

Sudden increase

Typical for core accretion. Constraint on  $M_{\text{crit}}$  & gas accretion rate

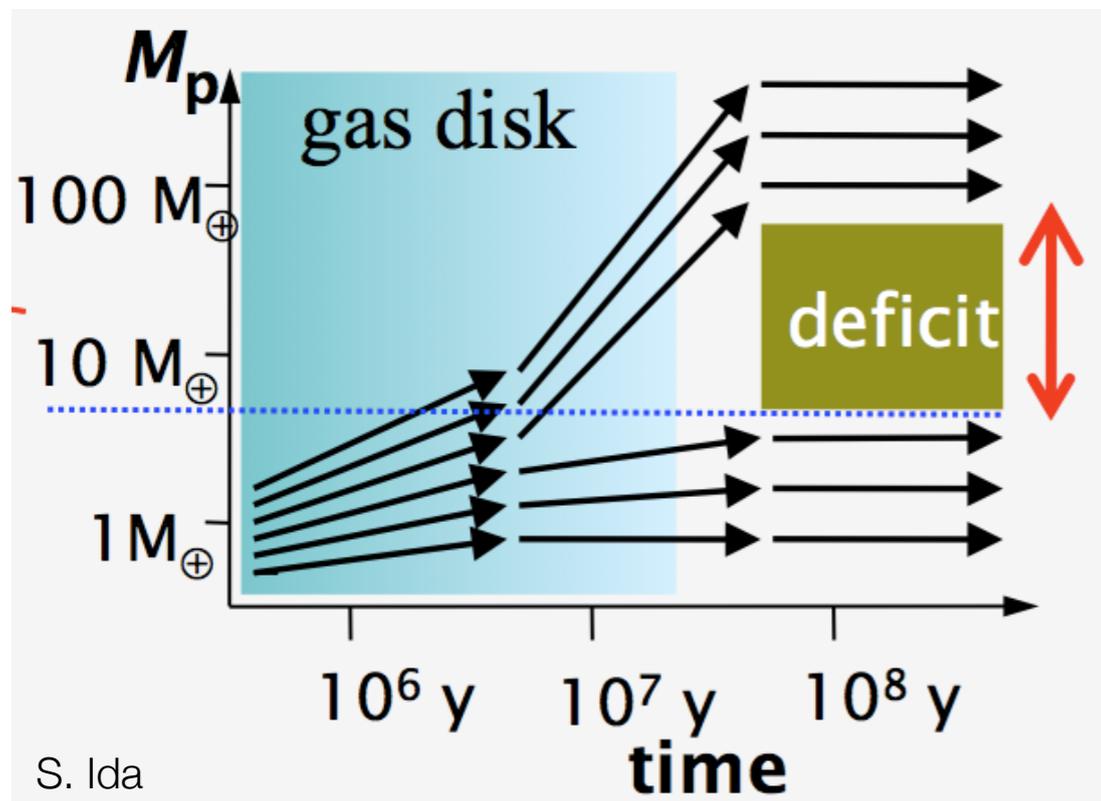
Many low-mass planet - much remains to be discovered



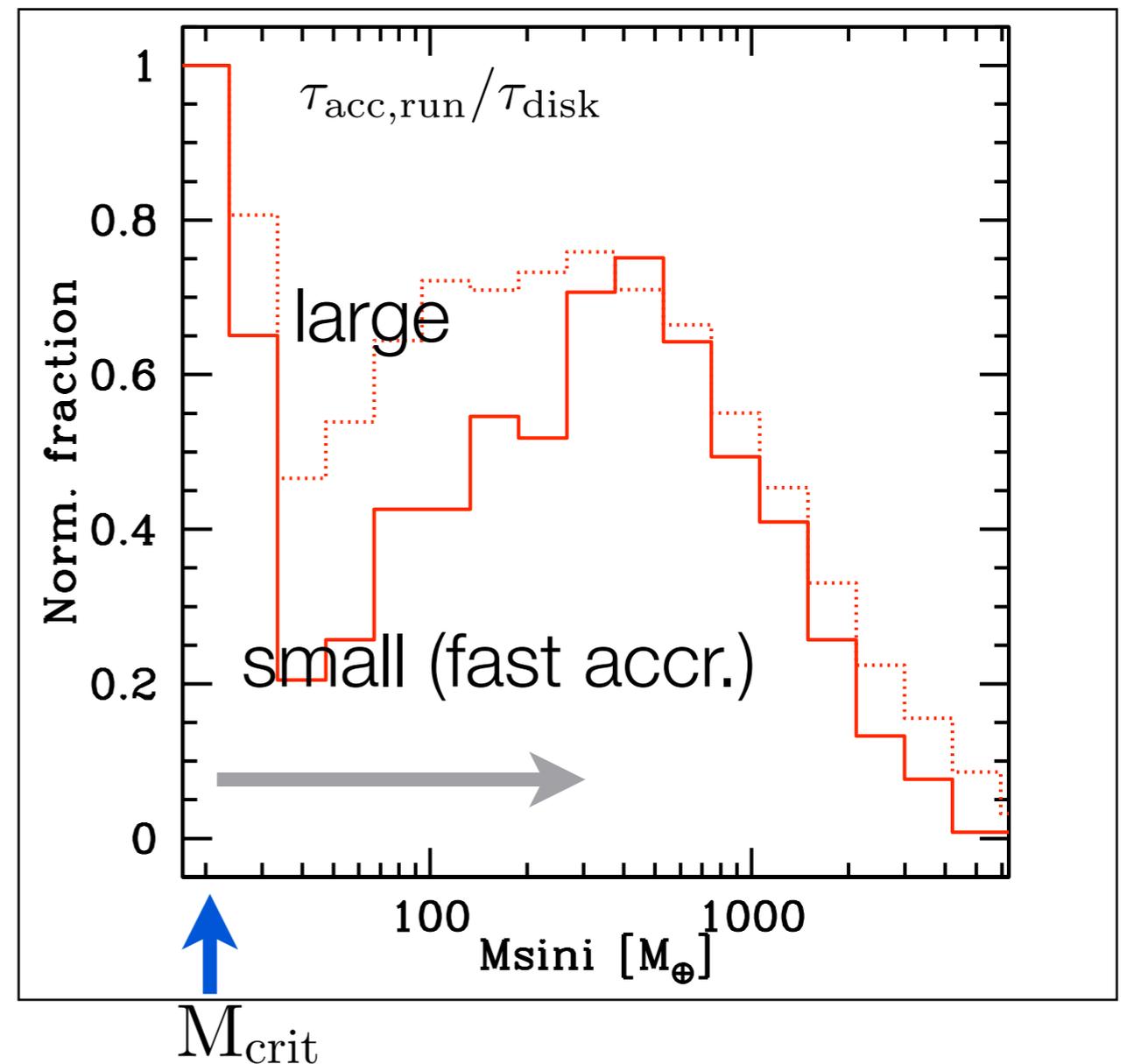
# Constraints in the P-IMF: transition

$M_{\text{crit}}$ : depends on luminosity, opacity and gas composition  $\sim 5\text{-}15 M_{\text{E}}$

Once  $M_{\text{crit}}$  is reached, rapid gas accretion begins.



If  $\tau_{\text{acc,run}}/\tau_{\text{disk}} \ll 1$ , a “planetary desert” can form.

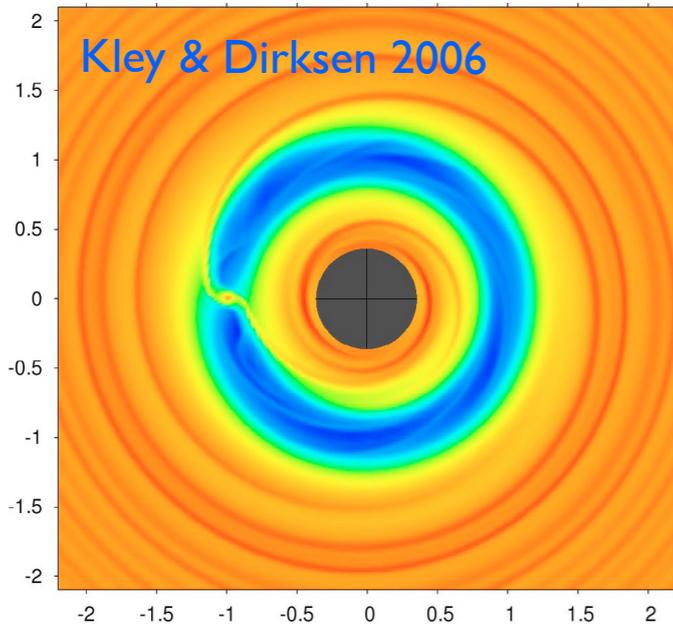


Depending on  $\tau_{\text{acc,run}}/\tau_{\text{disk}}$  P-IMF slope can be **positive, flat, negative**.  
Controlled by: local gas mass, viscous transport, Bondi rate,  $T_{\text{acc}} \sim T_{\text{KH}}(M)$

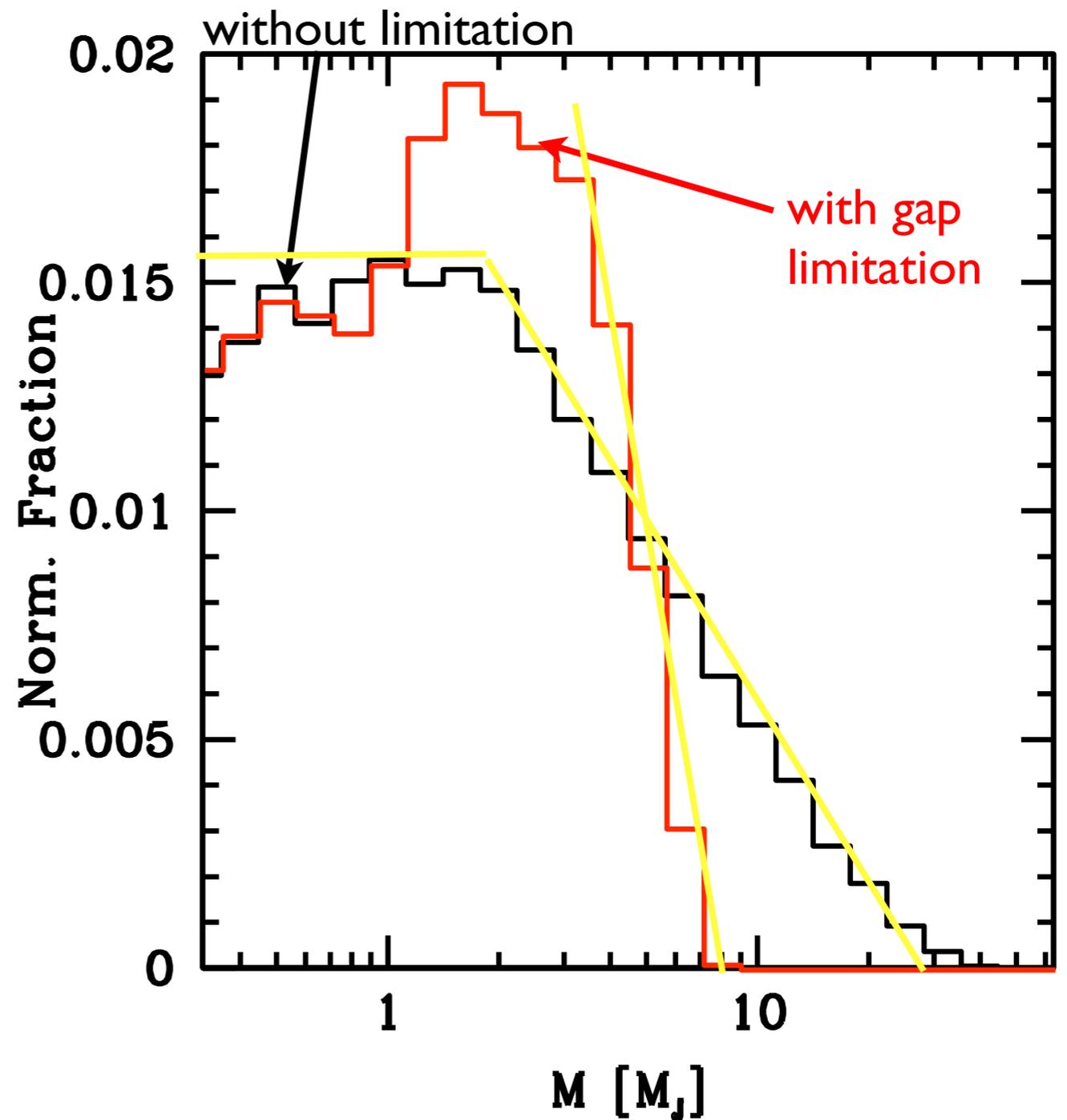
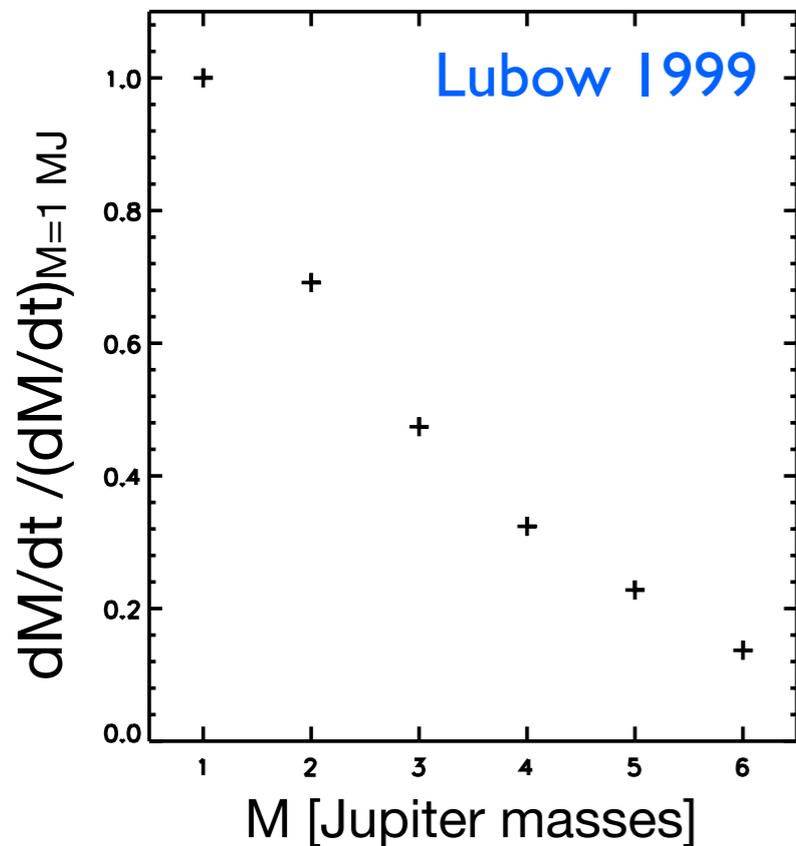


# Constraints in the P-IMF: upper end

Upper end of the P-IMF: controlled by disk mass & lifetime distributions, and gap formation.

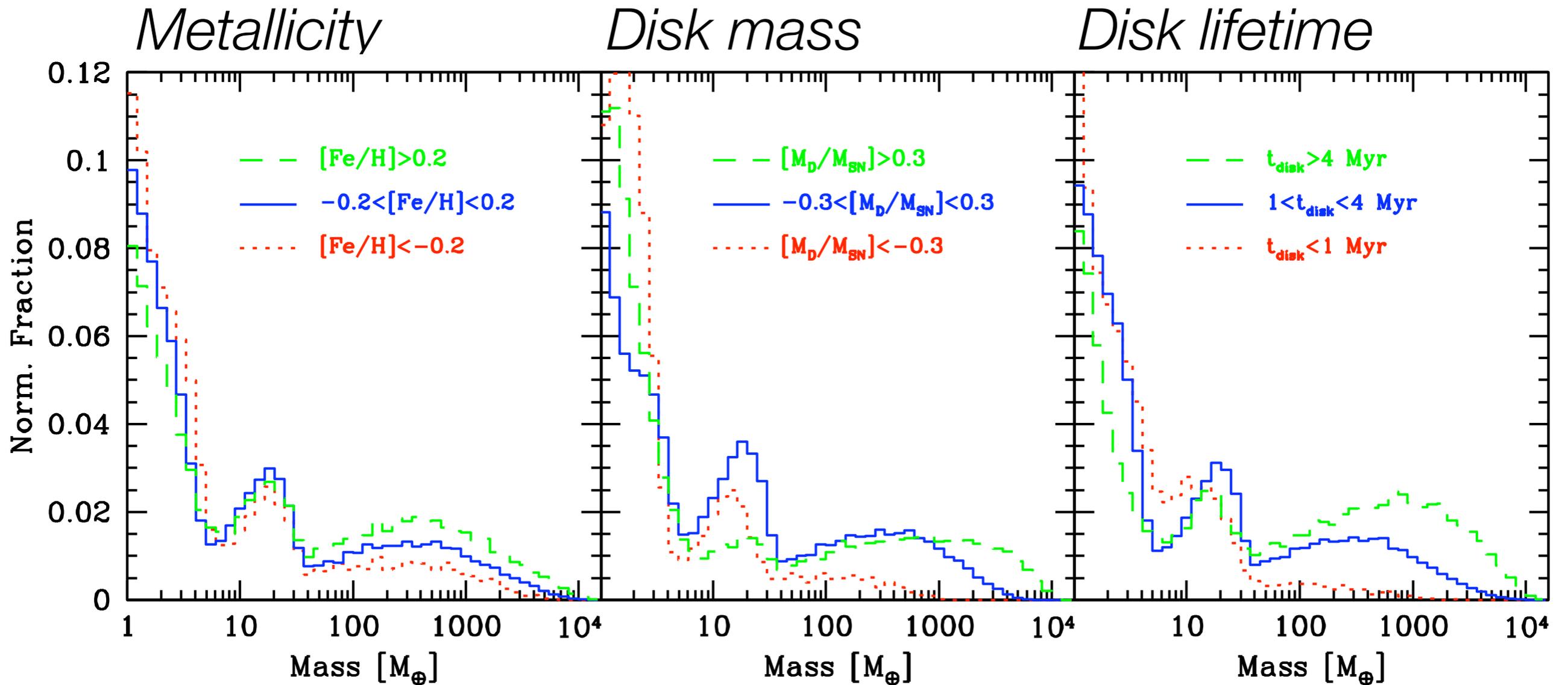


Gap:  
Auto-regulation  
of maximal  
planetary  
masses?





# *P-IMF: impact of disk properties*



- higher number of giants
- but not more massive
- Threshold mass ( $M_{\text{crit}}$ )

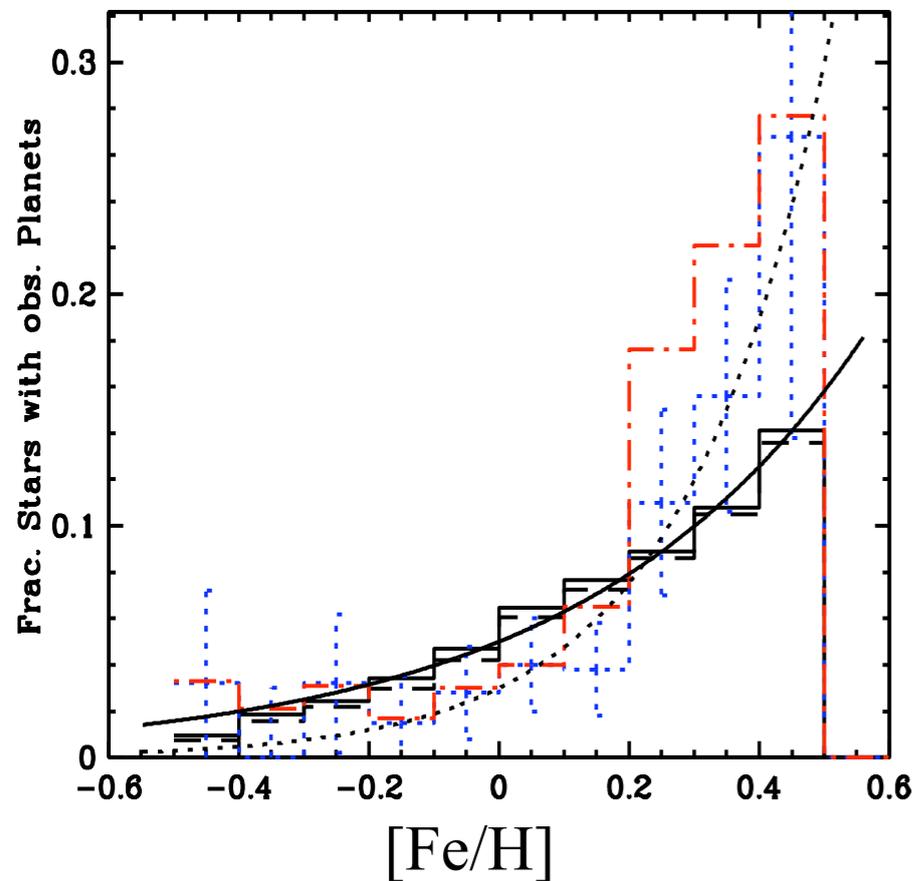
- correlation disk mass  
giant planet mass

- Long living disks: giants
- more numerous and
  - higher mass
- Correlation with  $M_D$



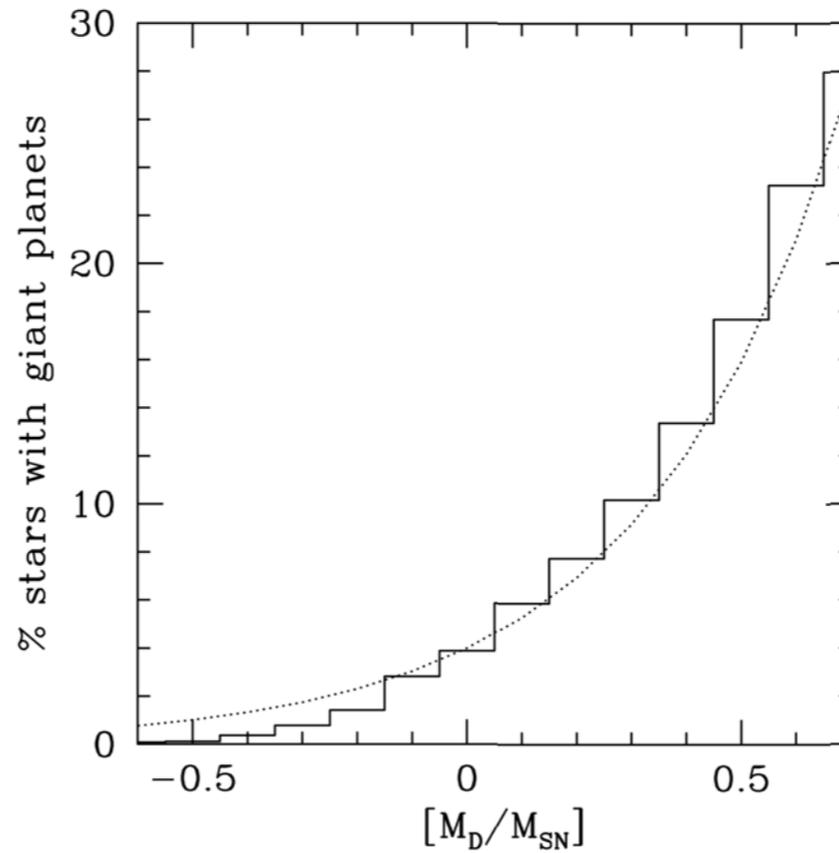
# Giant planet frequency

## Metallicity



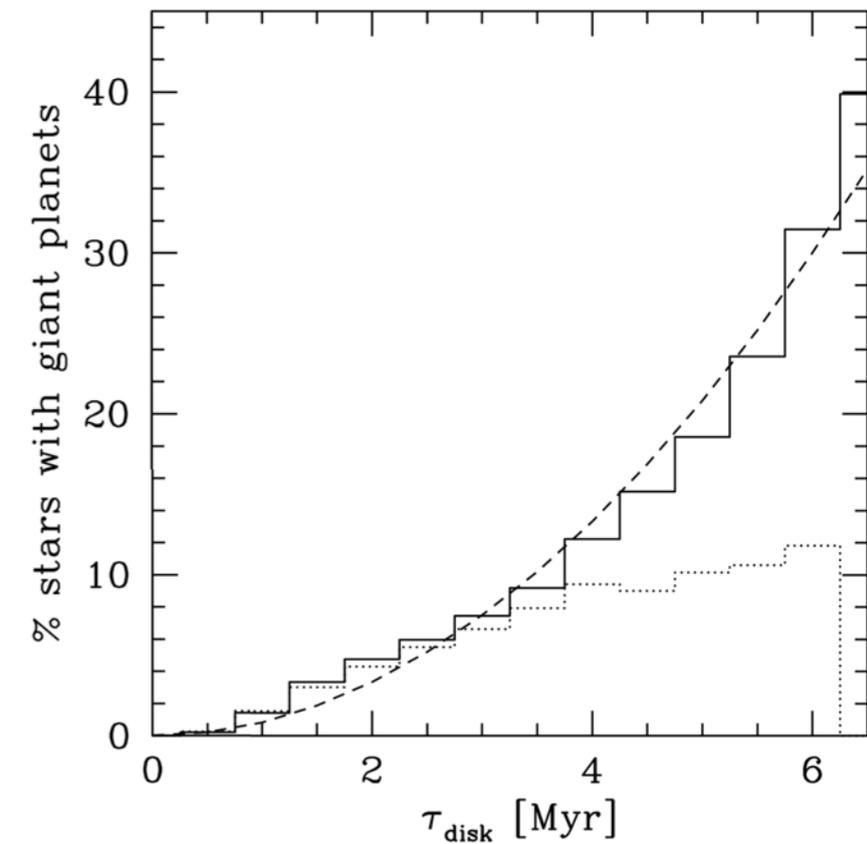
- Trend as observation, but weaker dependency
- Argument in favor of core accretion

## Disk mass



- Approximately linear
- $4 \times (M_{\text{disk}}/0.017 M_{\odot})^{1.2} \%$

## Disk lifetime



- Approximately quadratic
- $8 \times (T_{\text{disk}}/3 \text{ Myr})^2 \%$

Blue: Observation (Fischer & Valenti 2005)

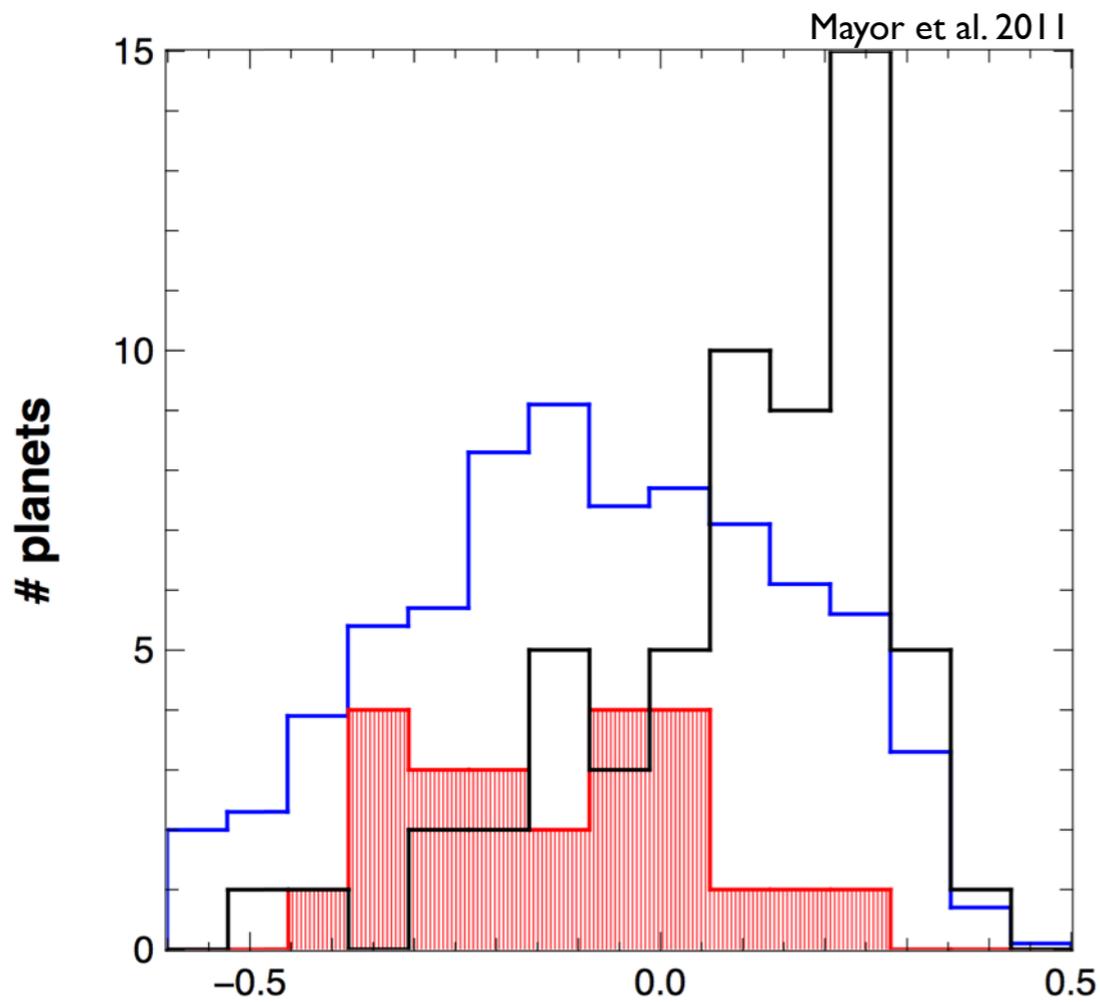
Red: Observation (Udry & Santos 2007)

Black: Observable synthetic planets



# Host star $[Fe/H]$ of giant and low-mass planets

## Observations



All stars  $[Fe/H]$  [dex]

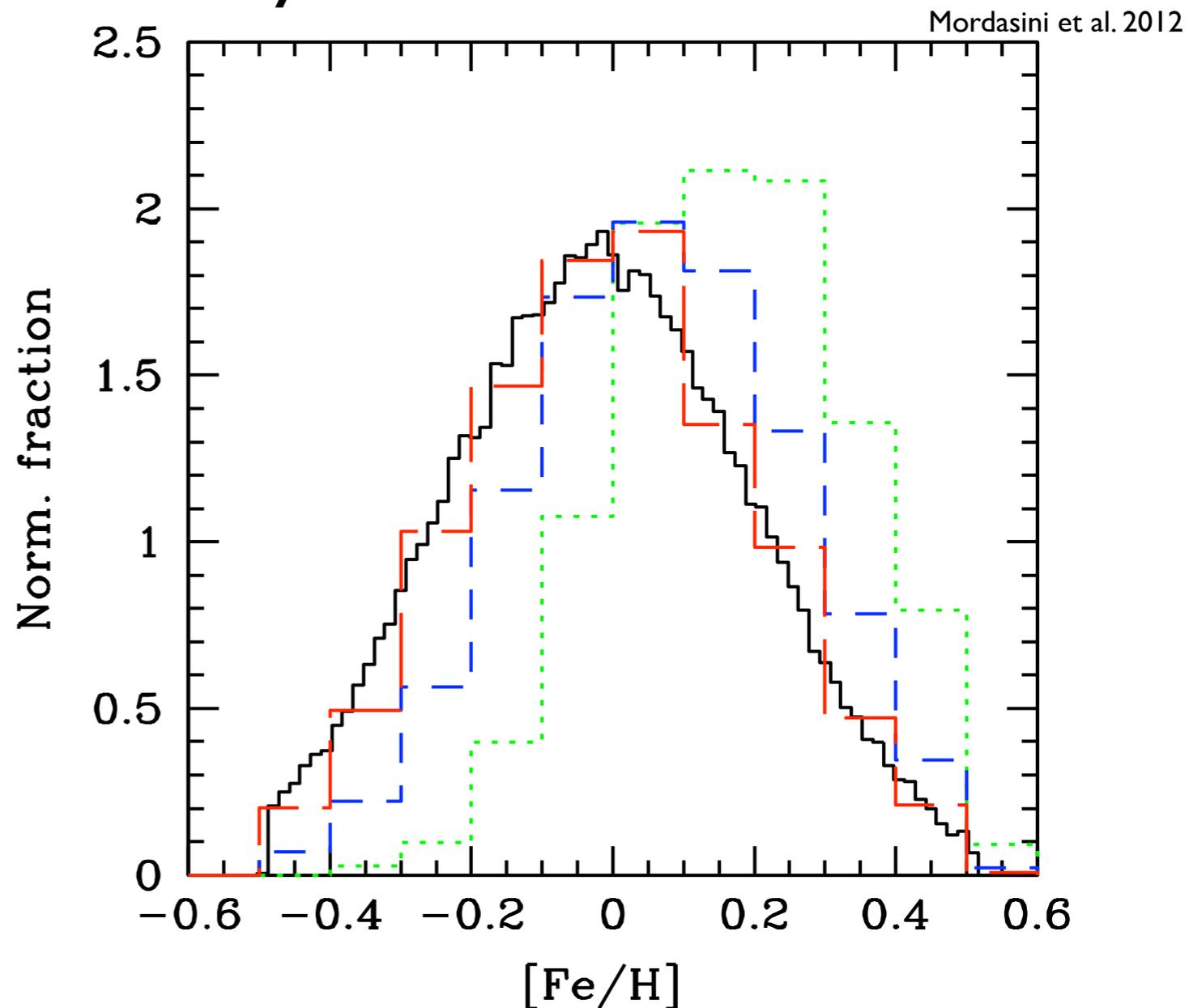
Giant planet host stars

Low-mass planet host stars  
( $M < 30 M_{\text{Earth}}$ )

Giant planet cores need to form early and massive: easier at high  $[Fe/H]$   
Low-mass planets can also form with lower  $[Fe/H]$

## Synthetic

$M_{\text{star}} = 1 M_{\odot}$   $a < 0.1$  AU



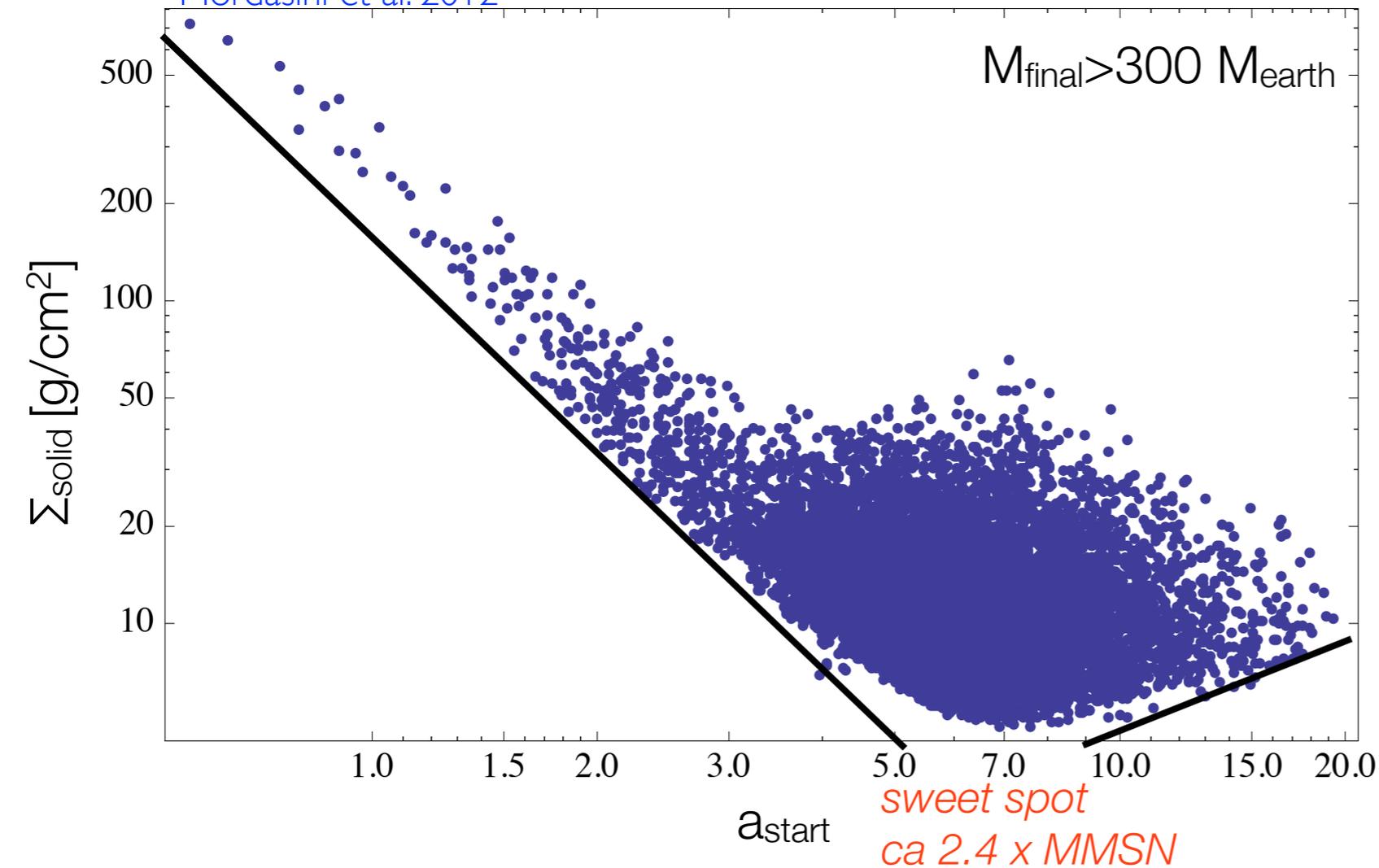
Mean $[Fe/H]$	$f_{\text{I}} = 0.1$	
All planets	-0.02	—
Hot, $M/M_{\oplus} < 6$	0.00	—
Hot, $6 < M/M_{\oplus} < 100$	0.06	- - -
Hot, $M/M_{\oplus} > 100$	0.17	⋯



# Preconditions for giant planets I

Study a posteriori which initial condition lead to a giant planet

Mordasini et al. 2012



Minimal necessary local planetesimal surface density.

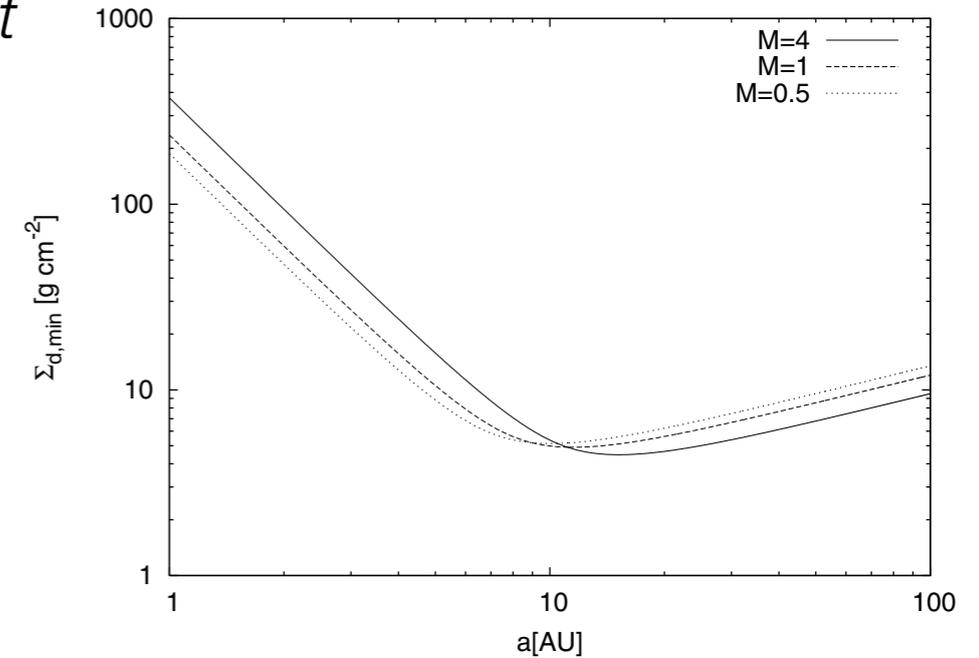
Inside: available mass criterion

-Migration relaxes the condition somewhat

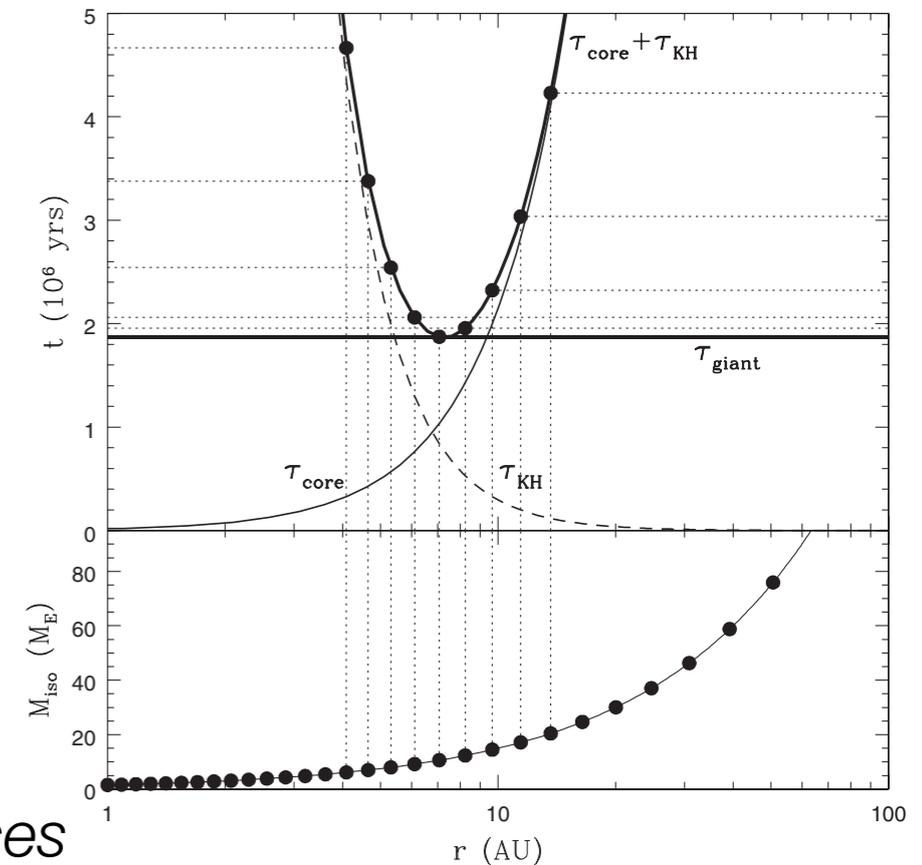
Outside: timescale criterion

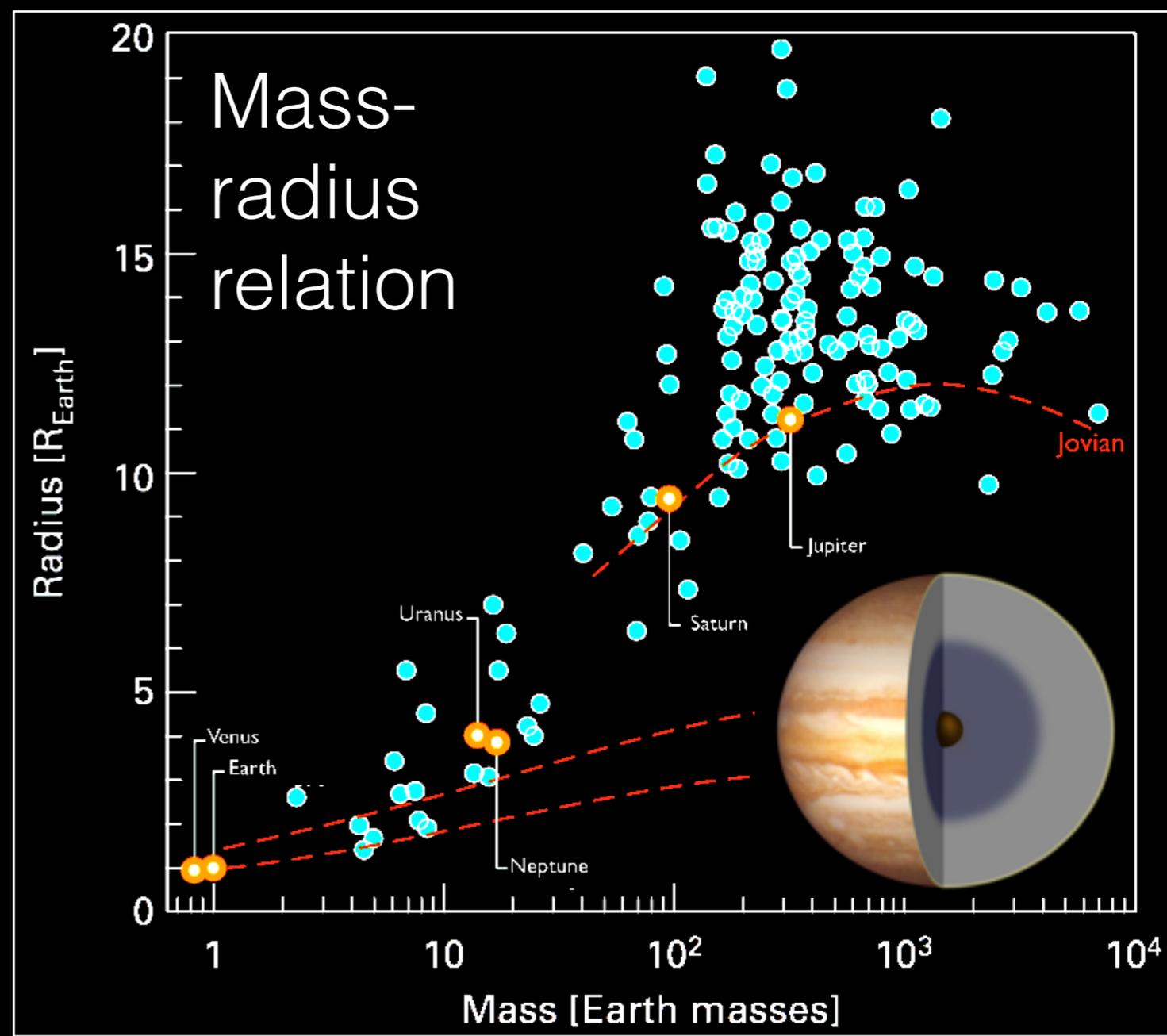
-Only long living disk make giants at low  $\Sigma_{\text{solid}}$  at large distances

Kornet et al. 2006



Thommes et al. 2008

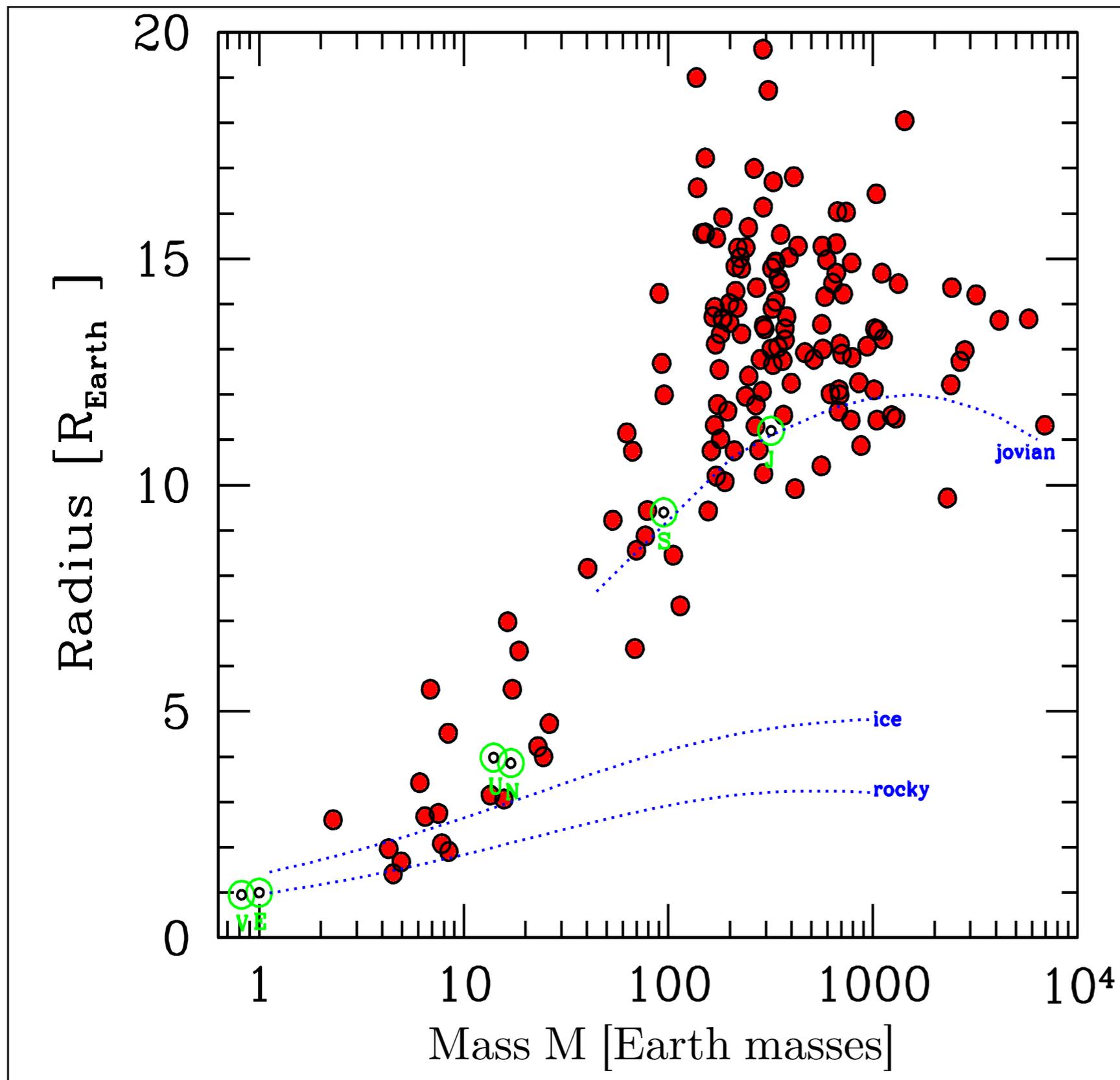




# 4. Statistical results on radii



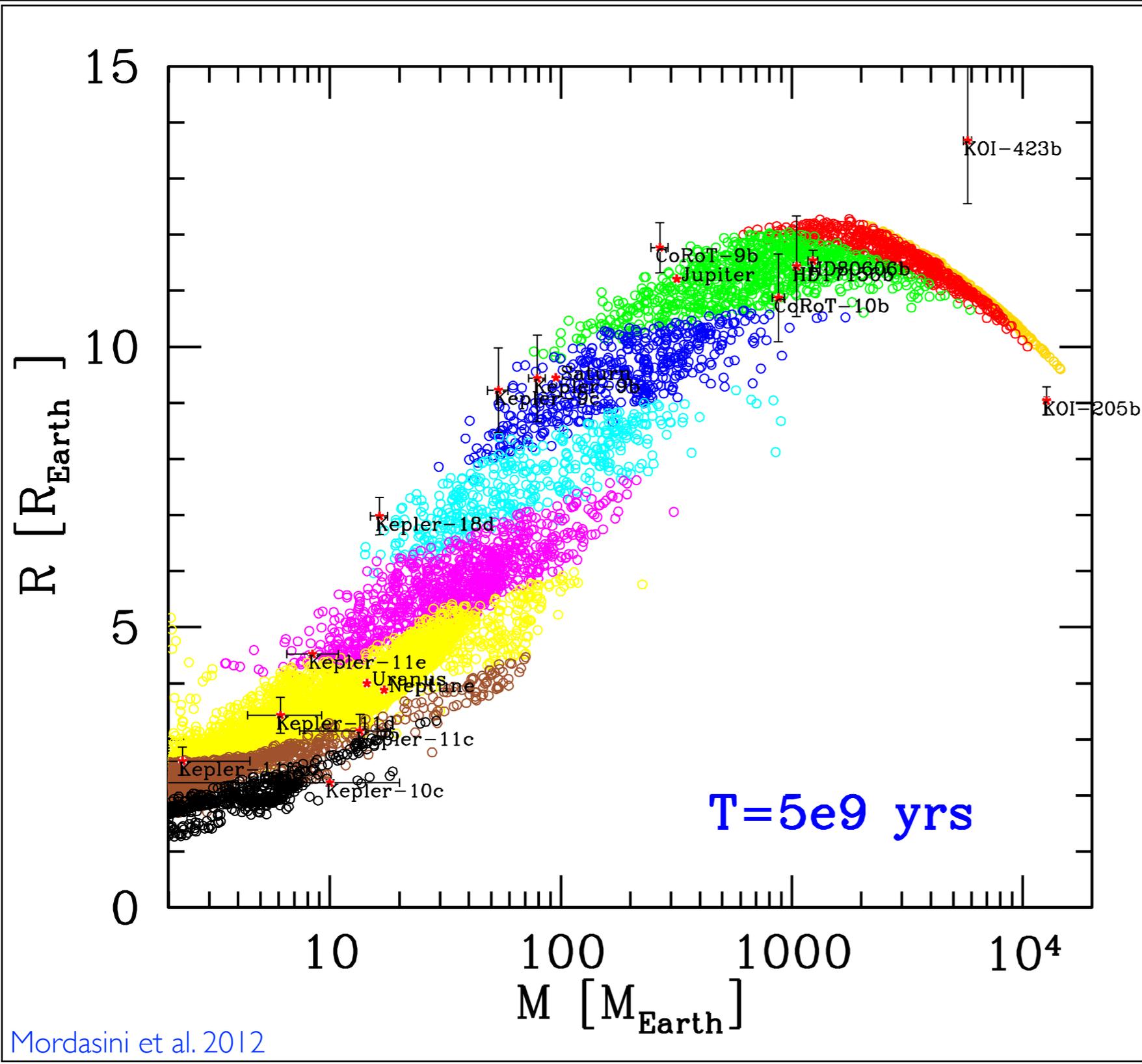
# Mass-radius relation



- M-R: First geophys. characterisation: rocky, icy, gaseous
- General trends
- Large diversity
- Inflated giant planets
- Empty regions
- Understandable with theoretical models?
- Constraints for formation theory beyond the a-M:
  - Transition solid-gas dominated planets: efficiency of H/He accretion & loss: opacity in protoplanetary atmosphere, atmospheric escape
- Must combine formation and evolution



# Formation of the M-R relationship



Fraction  $Z$  of solids  
(rest H/He)

- Orange:  $Z \leq 1\%$
- Red:  $1 < Z \leq 5\%$
- Green:  $5 < Z \leq 20\%$
- Blue:  $20 < Z \leq 40\%$
- Cyan:  $40 < Z \leq 60\%$
- Magenta:  $60 < Z \leq 80\%$
- Yellow:  $80 < Z \leq 95\%$
- Brown:  $95 < Z \leq 99\%$
- Black:  $Z > 99\%$

Rapid collapse at  
 $\sim 0.2 M_J$  when  $Z \approx 0.5$   
(runaway gas accretion)

After disk dispersal ( $T > 10$   
Myrs), slow contraction.

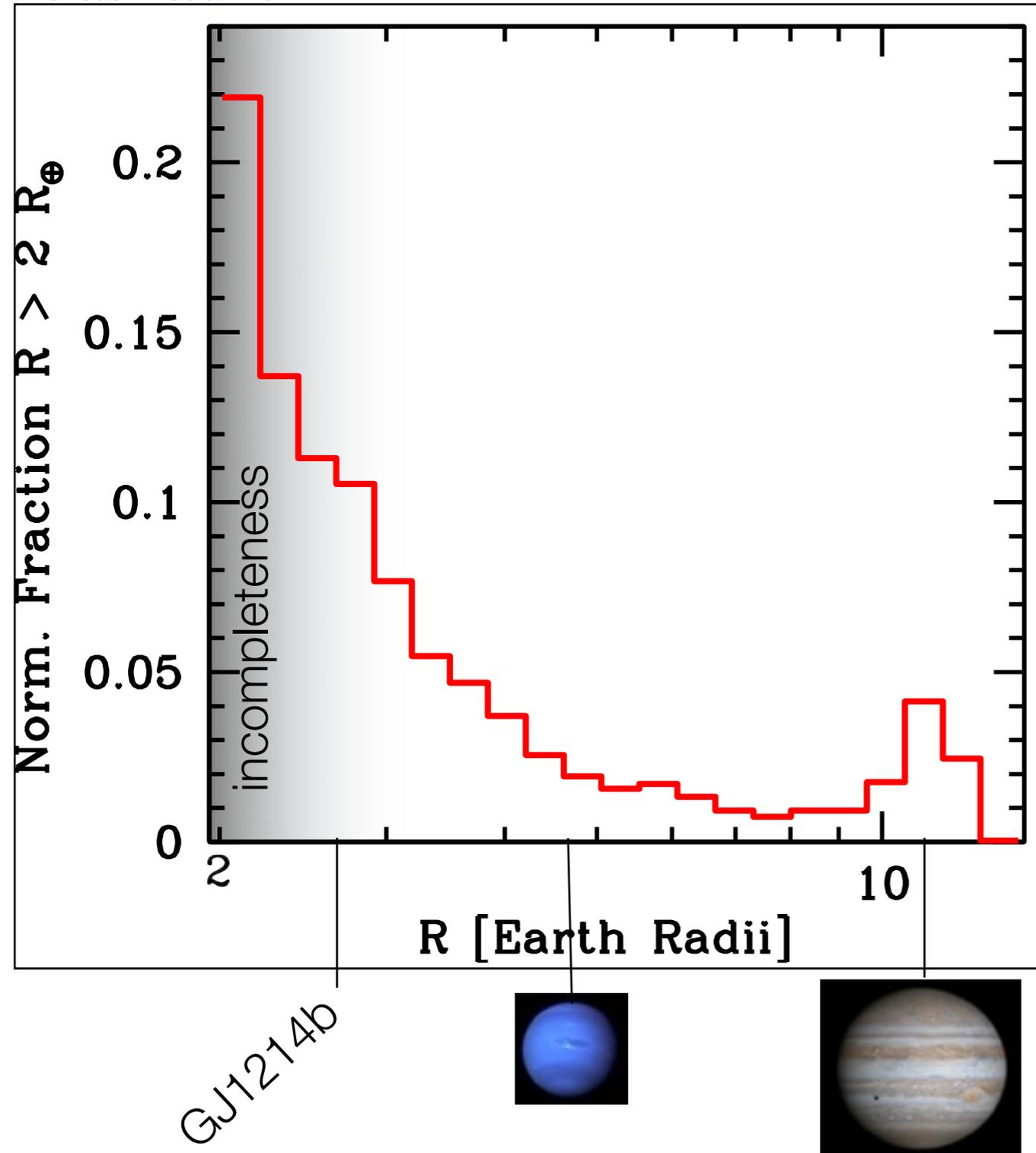
Characteristic S shape

$M_{\text{star}} = 1 M_{\text{sun}}$ .  $a > 0.1 \text{ AU}$ . Non-isothermal type I. cold accretion. 1 embryo/disk, no special inflation mechanisms, no evap.



# Planetary radius distribution

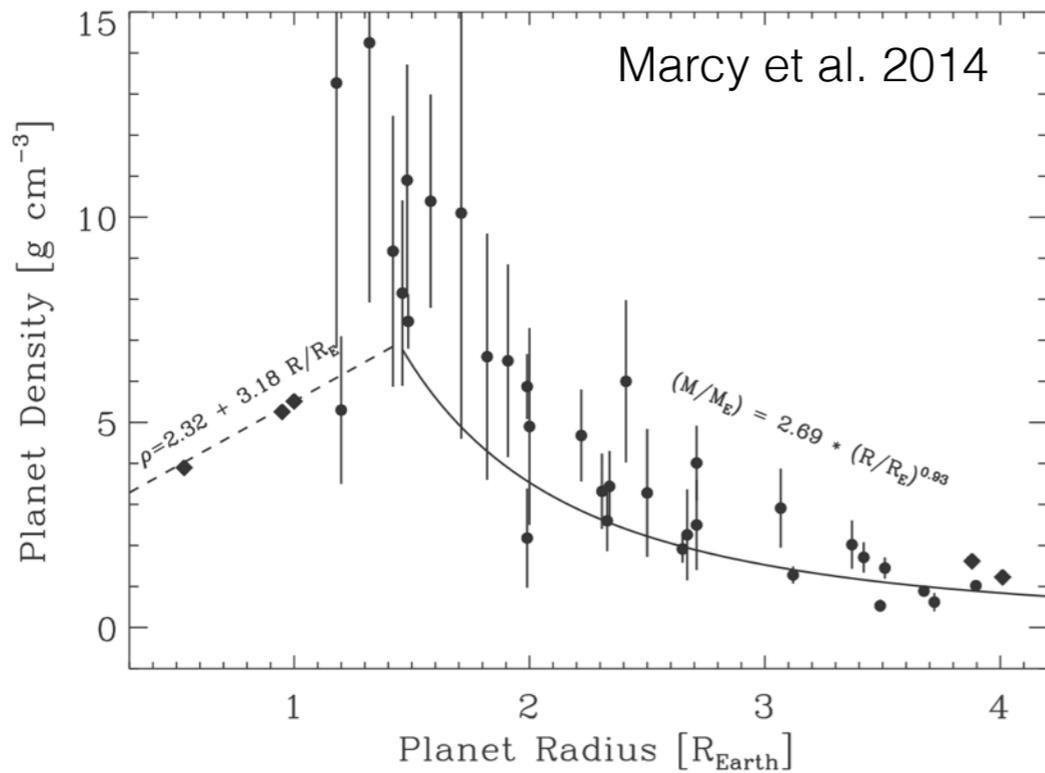
Mordasini et al. 2012



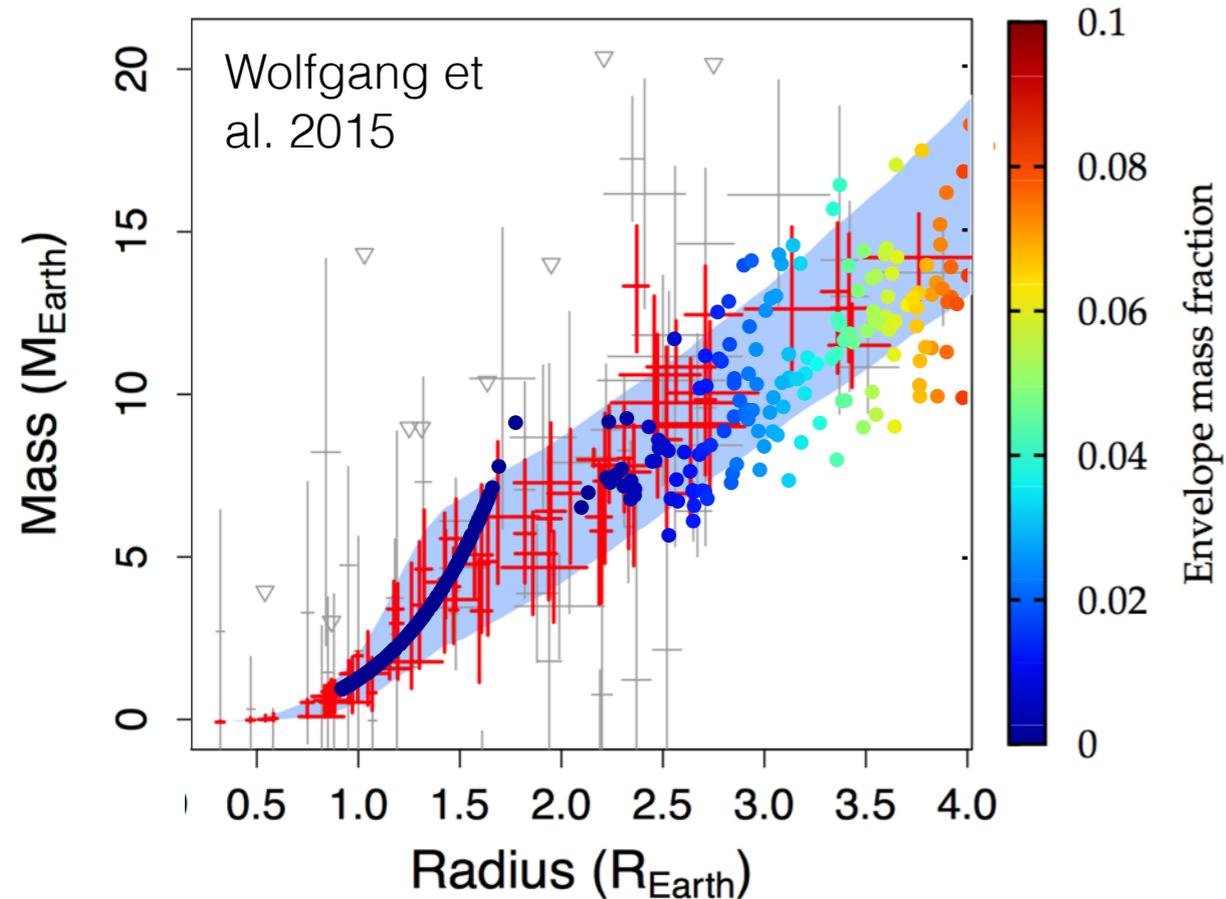
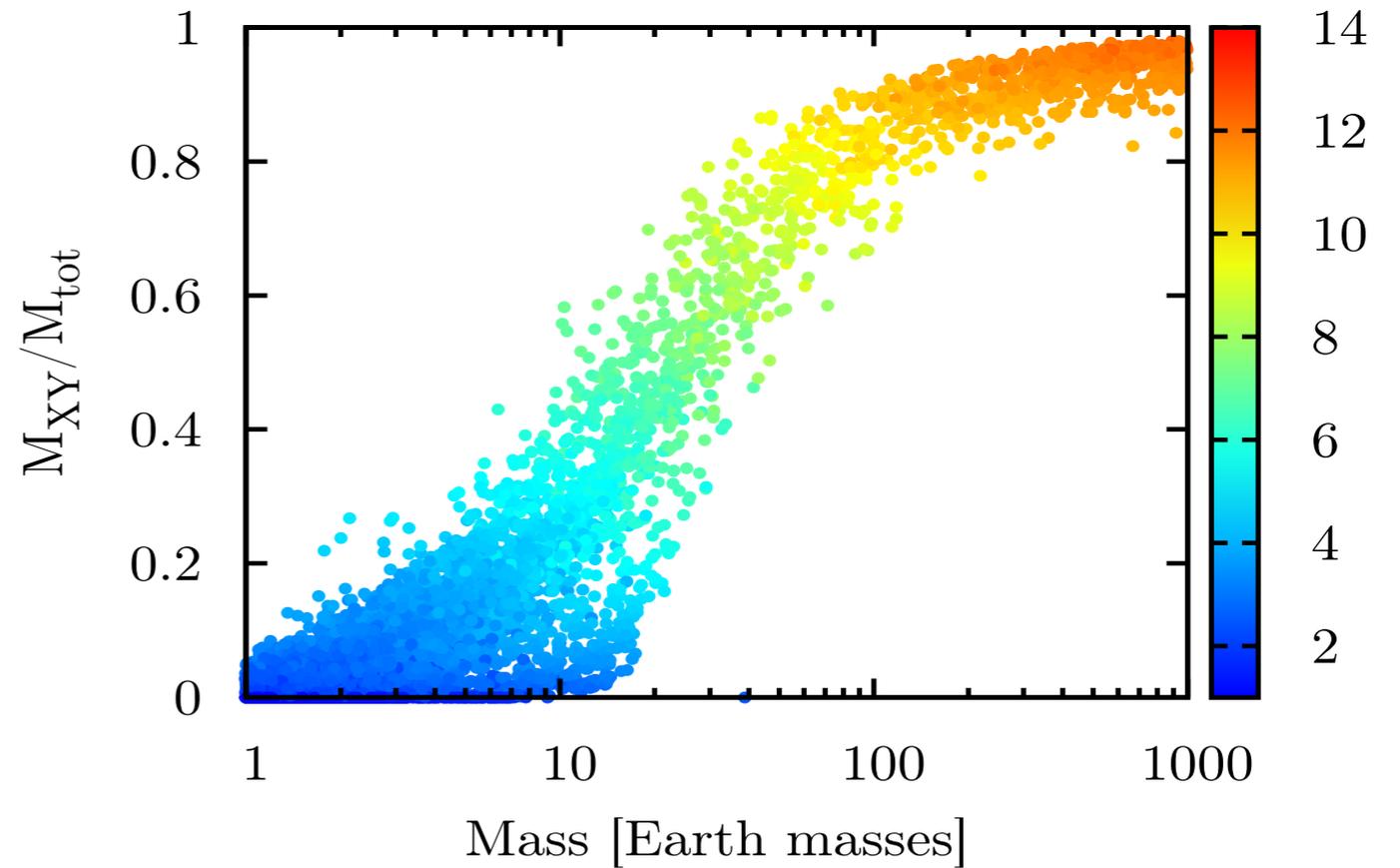
- Peak at lowest radii. High detection rate of Kepler.
- Second peak at  $\sim 1 R_J \Rightarrow$  Giant planets have all approx. *the same radius independent of mass* (degeneracy!)
- Peak: *prediction* for larger orbital periods (but over-predicted here: one opacity, one stellar mass, no bloating)



# Constraints on H/He fraction



Synthetic, grain opacity:  $0.003 \times \text{ISM}$



Increasing H/He mass fraction with mass

Theoretical result: dependency on grain opacity in protoplanetary atmosphere during formation

Podolak 2003, Movshovitz et al. 2010:  
numerical grain dynamics & opacity model  
Mordasini 2014, Ormel 2014: analytical models



# Mass-radius relationship

Mordasini et al. 2014

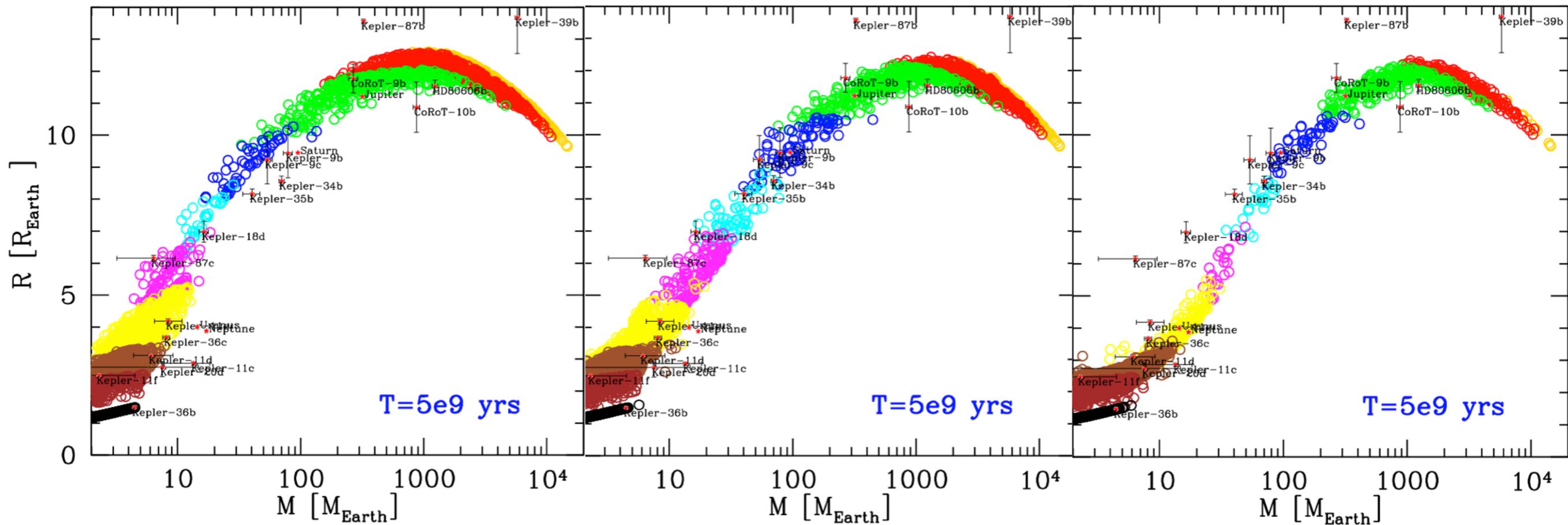
$0.1 < a/AU < 1$

Compare synthetic and observed M-R

Grain free ( $f_{opa}=0$ )

$f_{opa}=0.003$

ISM ( $f_{opa}=1$ )



$T=5e9$  yrs

$T=5e9$  yrs

$T=5e9$  yrs

too large  
too much H/He

radii similar  
as observed

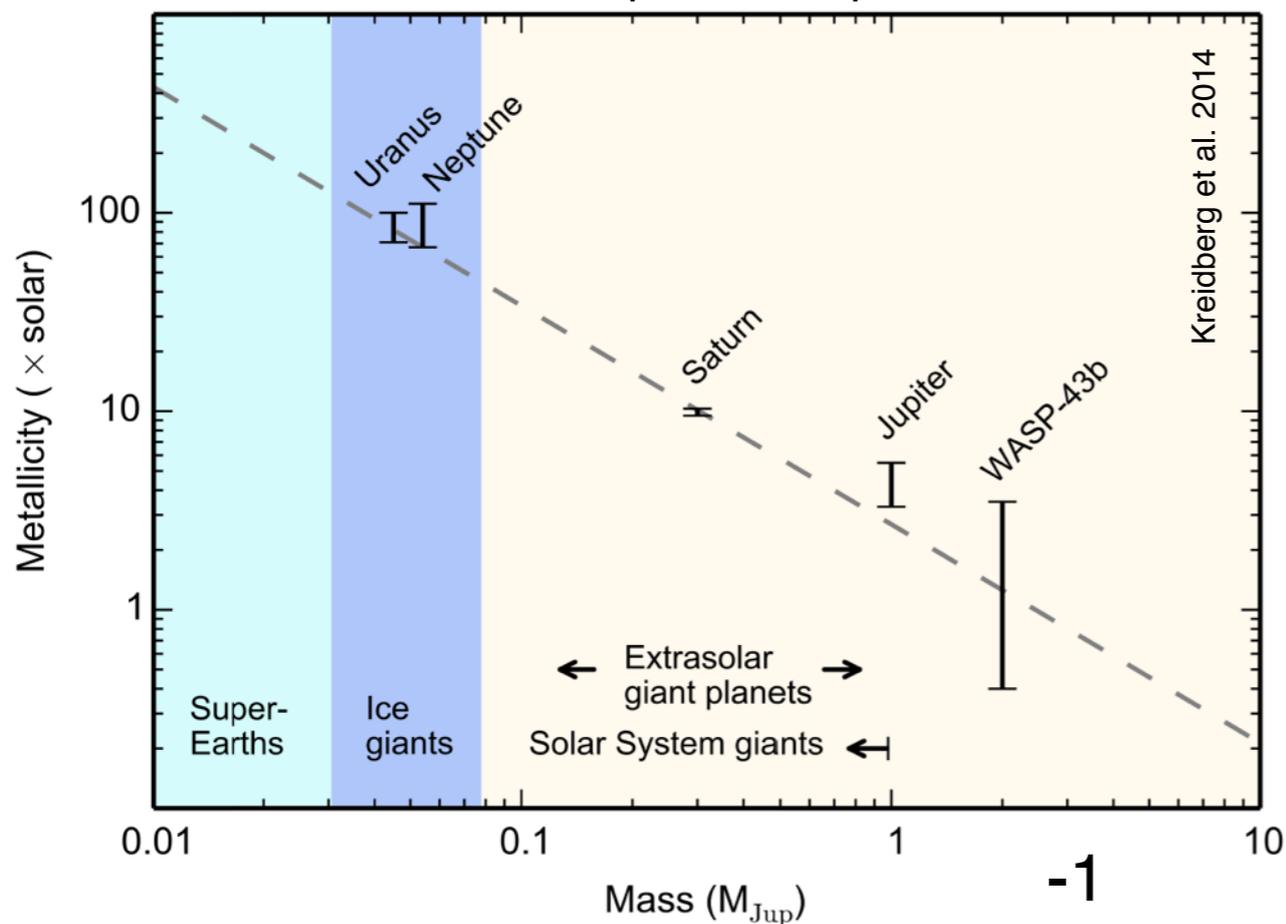
too small  
too little H/He

Observational constraints from M-R relation on microphysical grain models.

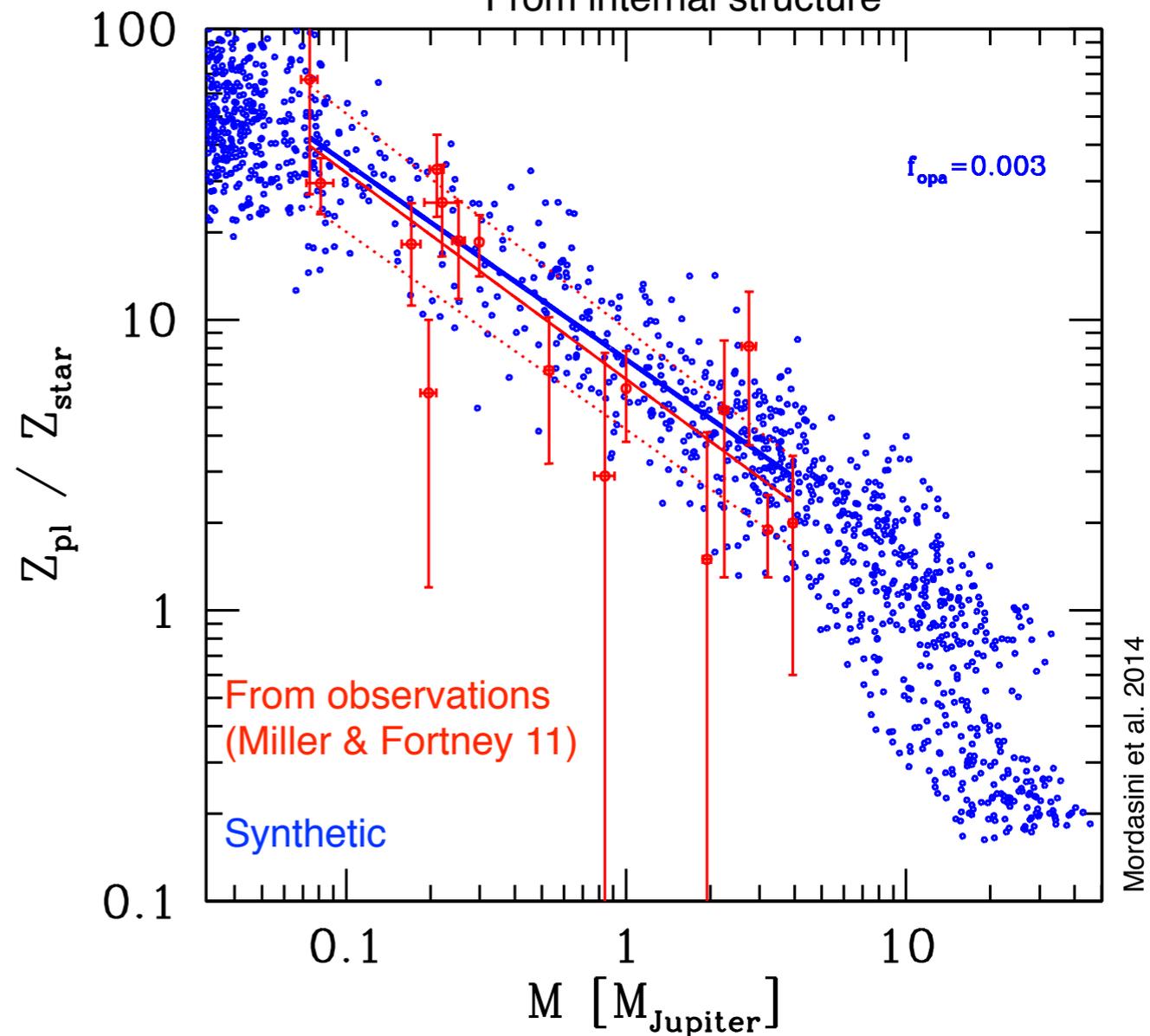


# Enrichment relative to host star

From atmospheric composition



From internal structure



$$\frac{Z_{\text{pl}}}{Z_{\text{star}}} = \beta \left( \frac{M}{M_{2+}} \right)^{\alpha}$$

$\beta$  → 2-9 (opacity)  
 $\alpha$  → -1 simplest CA  
 $\alpha$  → -2/3 feeding zone  
 $\alpha$  → 0 grav. instability (?)

Data set	$\alpha$	$\beta$
Miller & Fortney (2011)	$-0.71 \pm 0.10$	$6.3 \pm 1.0$
$f_{\text{opa}} = 0$	-0.73	3.5
$f_{\text{opa}} = 0.003$	-0.68	7.2
$f_{\text{opa}} = 1$	-0.72	8.5
$f_{\text{opa}} = 0.003$ , in situ, $\dot{M}_{Z,\text{run}} = 0$	-0.88	2.4

# 4. Conclusions

- Population synthesis is a tool to compare theory and observation to improve understanding of planet formation
  - use full wealth of observational constraints
  - put detailed models to the test
  - see global statistical consequences
- Observational constraints on many processes
  - solid and gas accretion rate ( $T_{KH}$ )
  - grain dynamics
  - orbital migration rate
- See link between disk and planetary properties
- Predict yield of future instruments/space missions
- Continuously evolving models
  - population syntheses depend on progress of formation theory as a whole
  - a lot to do



# *DACE*

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Online demonstration

[www.dace.unige.ch](http://www.dace.unige.ch)