

# Weighing the Galaxy

Robyn Sanderson  
ISSS, Summer 2019

# getting oriented: a simulated MW analog

Dark Matter (CDM)

Stars

100 kpc

100 kpc

FIRE-2 simulation *m12i*, Wetzel et al 2016

# A simple mass estimator - the rotation curve

$$\vec{F}_{\text{centrip}} = \vec{F}_{\text{grav}}$$

↓ Spherical symmetry

$$\vec{F} = F_r \hat{r}$$

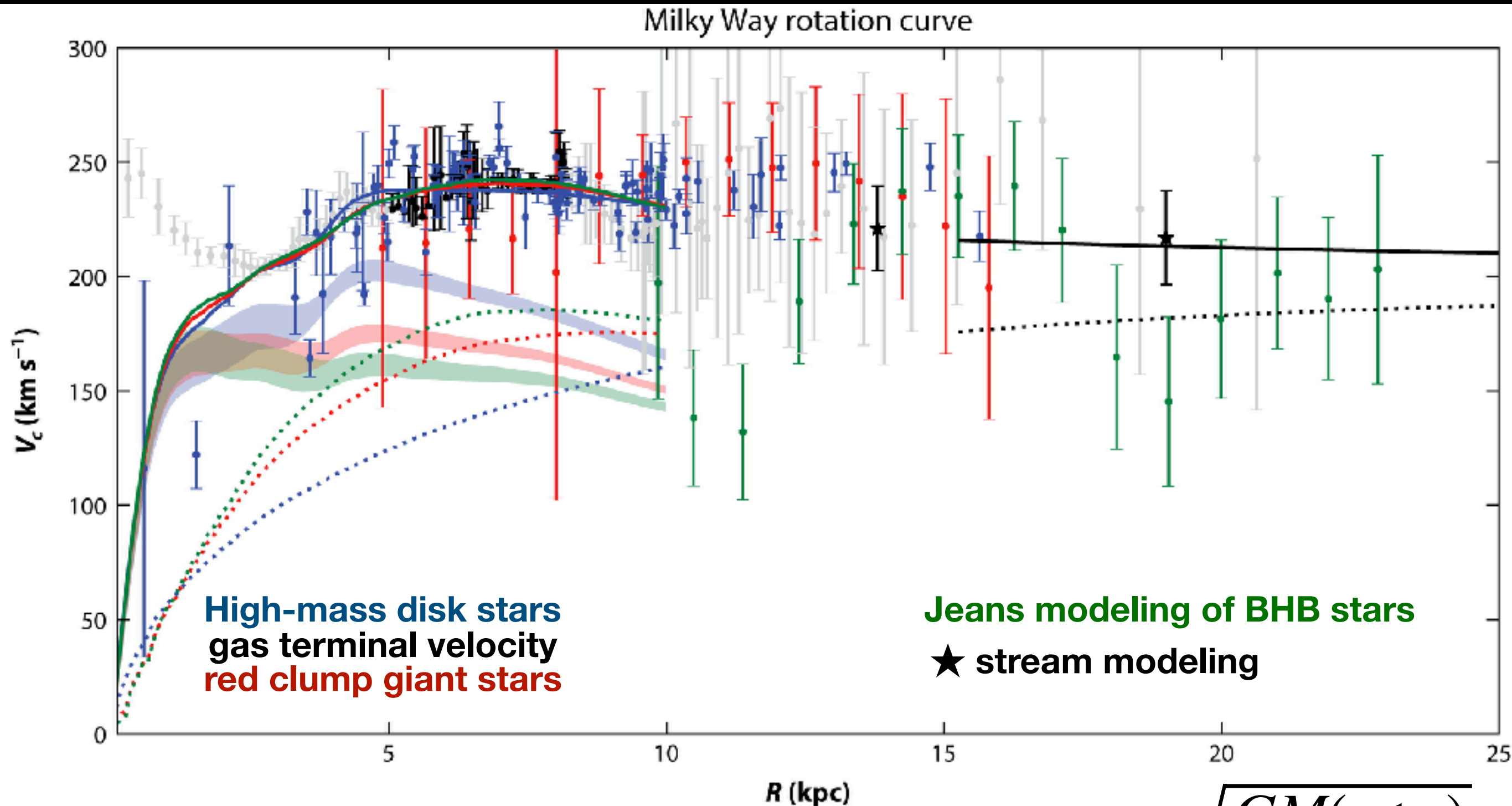
↓ Gauss's Law

$$\frac{v_c^2(r)}{r} = \frac{GM(< r)}{r^2}$$

↓

$$v_c(r) = \sqrt{\frac{GM(< r)}{r}}$$

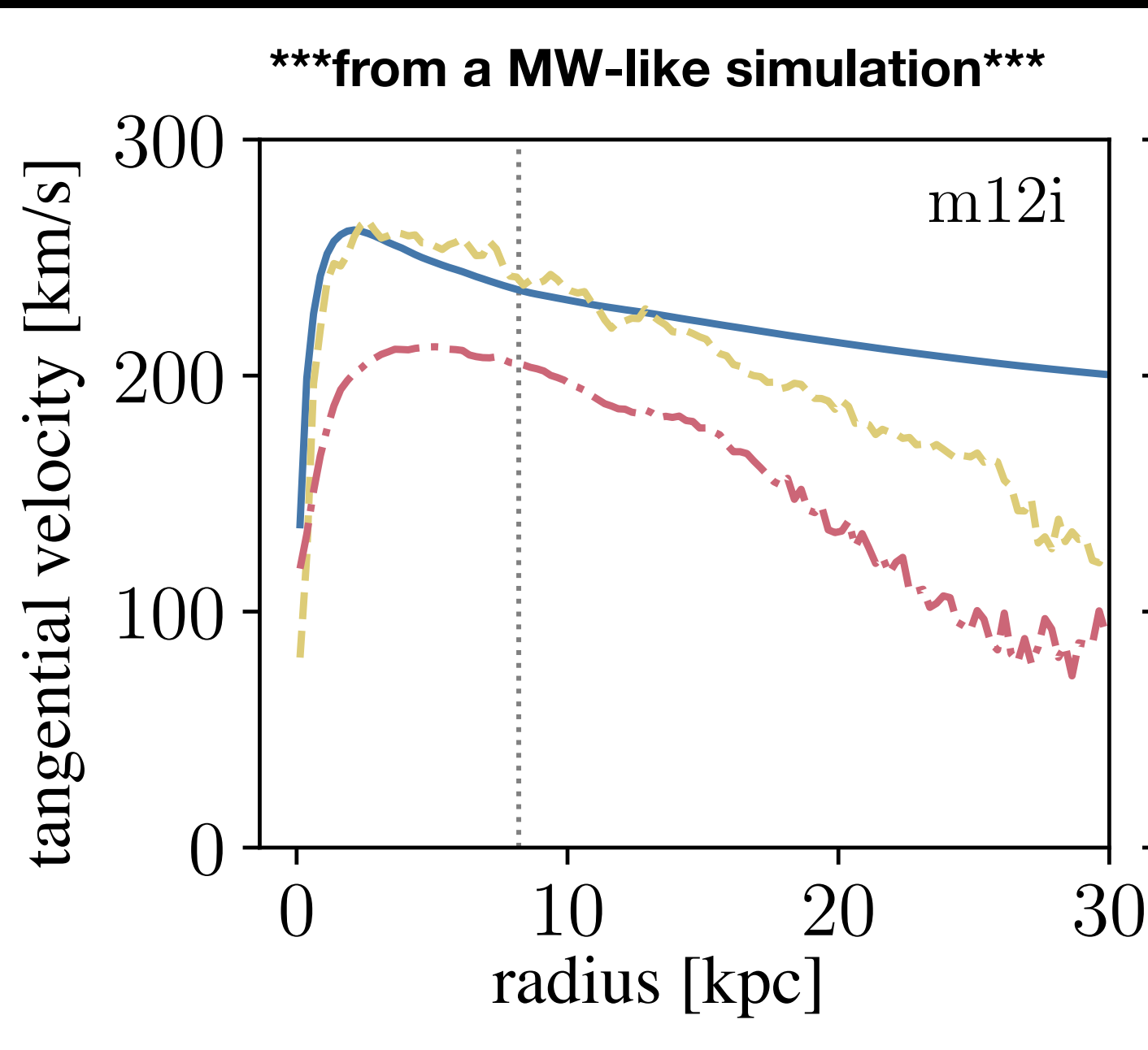
# the rotation curve before Gaia



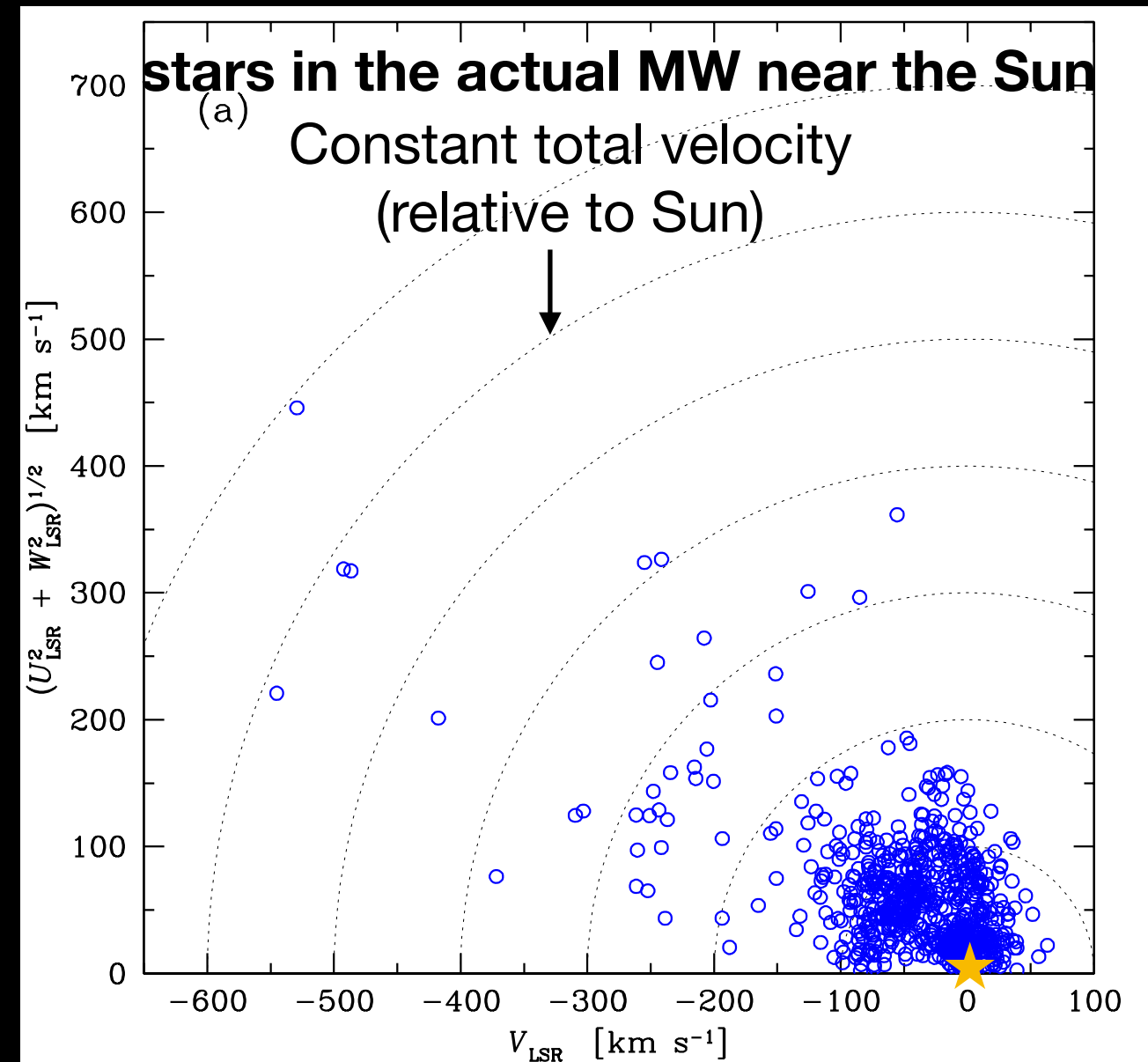
$$v_c(r) = \sqrt{\frac{GM(< r)}{r}}$$



# the rotation curve - not just stellar velocities

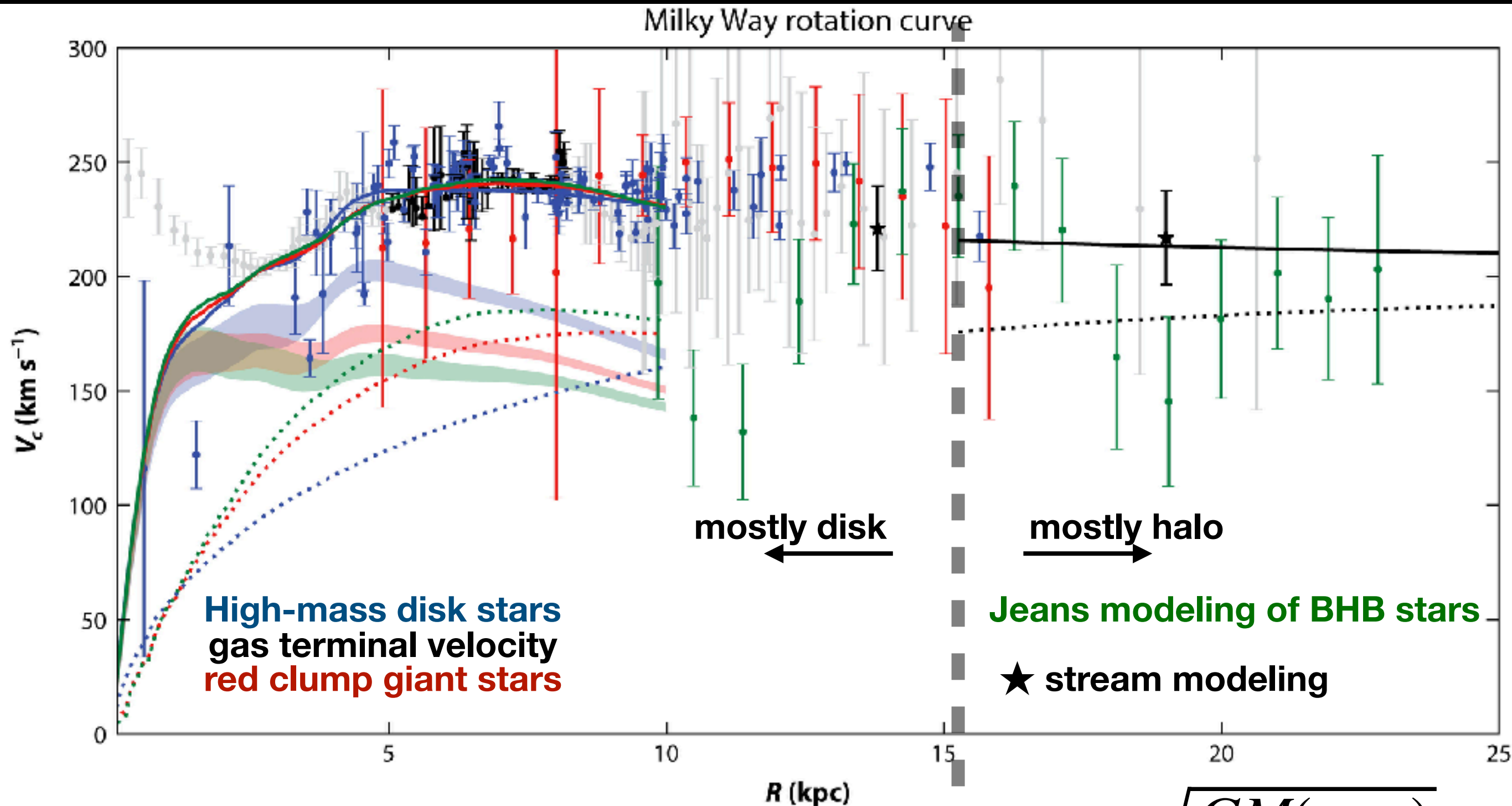


Sanderson et al. 2018



Bensby et al. 2014

# the rotation curve before Gaia



$$v_c(r) = \sqrt{\frac{GM(< r)}{r}}$$

# Jeans analysis - a [not quite as] simple mass estimator

## Ingredients:

- \* Collisionless Boltzmann Equation (stars are independent)
- \* Poisson Equation (relation between mass and gravitational force)

$$\nu(\vec{x}) \equiv \int d^3\vec{v} f(\vec{x}, \vec{v}) \quad n(\vec{x}) = N\nu(\vec{x}) \quad \text{phase-space distribution function (DF)}$$

$$\cancel{\frac{\partial f}{\partial t}} + \frac{\partial f}{\partial \vec{x}} \cdot \underbrace{\frac{\partial H}{\partial \vec{v}}}_{=\vec{v}} - \underbrace{\frac{\partial H}{\partial \vec{x}}}_{=\vec{\nabla}\Phi} \cdot \frac{\partial f}{\partial \vec{v}} = 0$$

**CBE**, assuming

$$H = \frac{1}{2}v^2 + \Phi(\vec{x})$$

$$\boxed{\vec{v} \cdot \frac{\partial f}{\partial \vec{x}} - \frac{\partial \Phi}{\partial \vec{x}} \cdot \frac{\partial f}{\partial \vec{v}} = 0}$$

**Take moments of this with respect to velocity to get Jeans eqs.**

$$\nabla^2 \Phi = 4\pi G \rho(\vec{x}) \quad \rho(\vec{x}) \sim m_* N \nu(\vec{x}) \quad \text{Poisson's Equation}$$

# Jeans analysis - a [not quite as] simple mass estimator

- Start with collisionless Boltzmann equation
- Multiply by some power of velocity & integrate [over velocity]
- Not generically closed
- To close, make assumptions about the distribution function and/or system symmetries
- for the halo, **spherical symmetry** & **steady state** (equilibrium) often assumed

$$\frac{d(\nu \overline{v_r^2})}{dr} + \nu \left( \frac{d\Phi}{dr} + \frac{2\overline{v_r^2} - \overline{v_\theta^2} - \overline{v_\phi^2}}{r} \right) = 0$$

$$\beta \equiv 1 - \frac{\overline{v_\theta^2} + \overline{v_\phi^2}}{2\overline{v_r^2}}$$

$$\frac{d(\nu \overline{v_r^2})}{dr} + 2\frac{\beta}{r}\nu \overline{v_r^2} = -\nu \frac{d\Phi}{dr}$$

**this term tells us M(<r) via Poisson eq.**

$$\nu \equiv \int d^3\vec{v} f(\vec{x}, \vec{v})$$

$$n(\vec{x}) = N\nu(\vec{x})$$

**need to count tracers**

$$\sigma_{ij}^2 \equiv \overline{v_i v_j} - \overline{v_i} \overline{v_j}$$

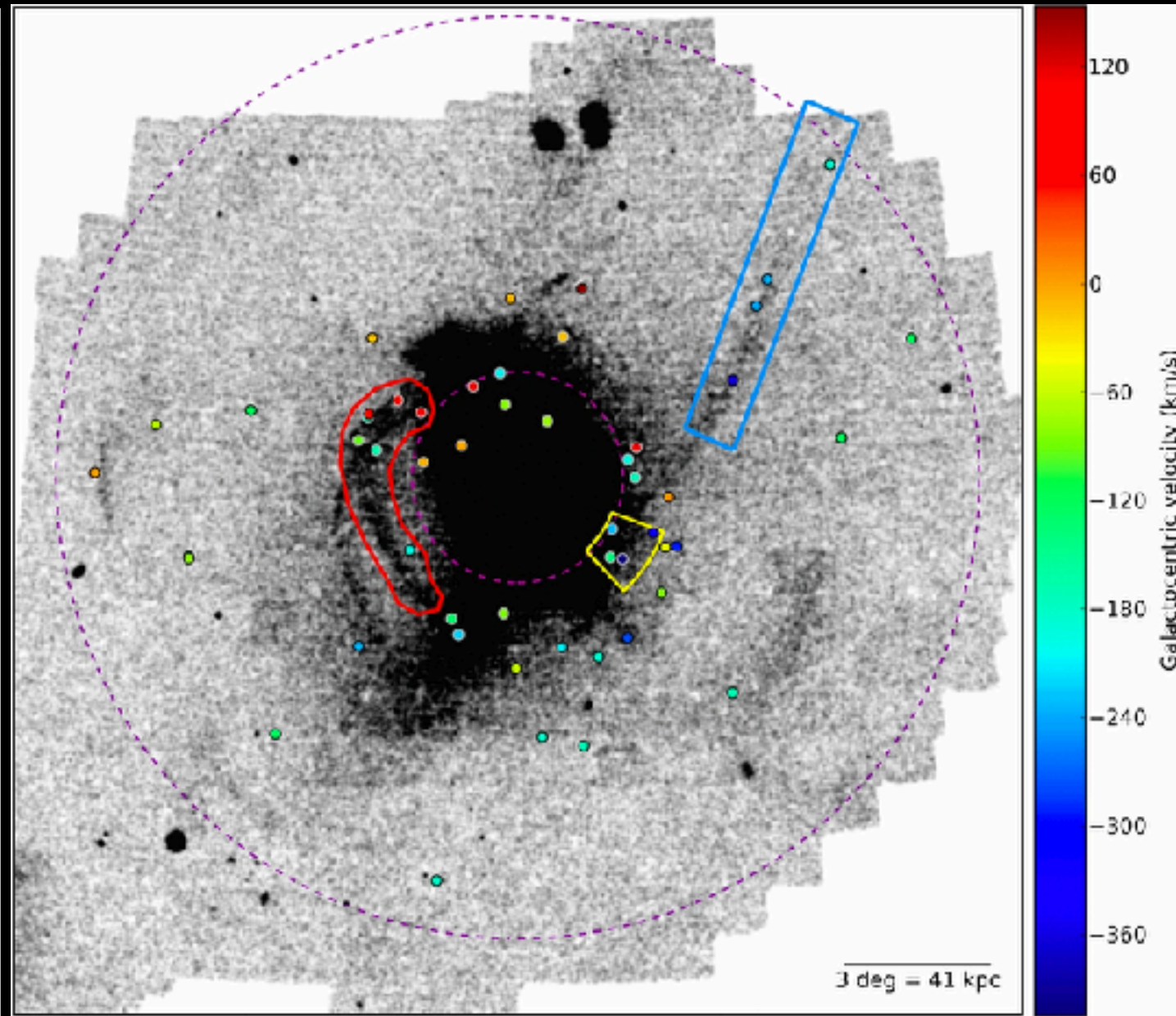
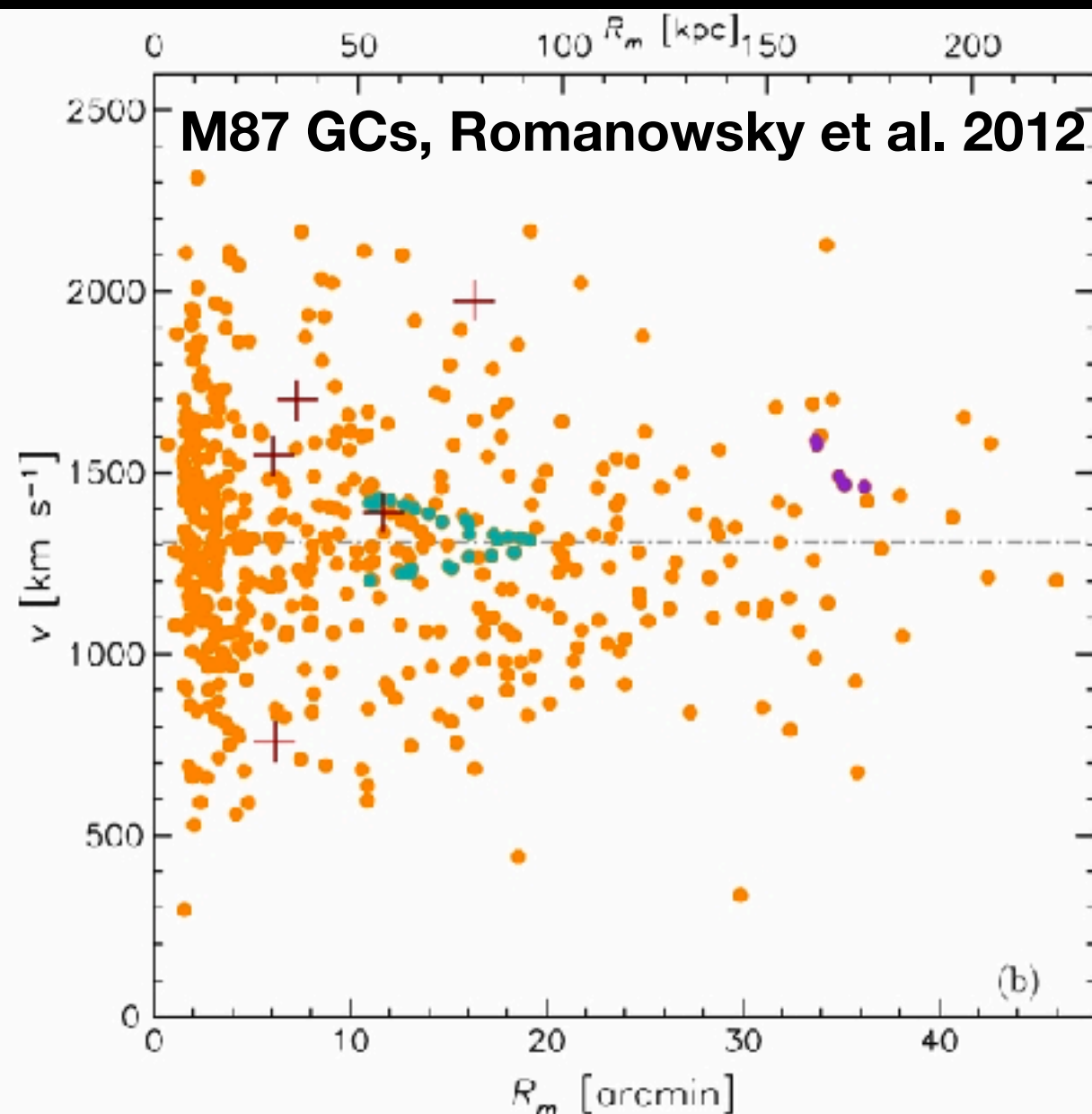
$$\text{e.g. } \overline{v_i^2} \equiv \sigma_i^2 + \underbrace{(\overline{v_i})^2}_0$$

(for  $\theta, \phi$ : **non-rotating**)

we actually measure:

- $\sigma_{\text{los}}$  (before Gaia) and maybe  $\beta$  (with HST or Gaia)
- $n(r)$  and [noisily]  $dn/dr$  for some subsample of tracers

# Jeans analysis - what is in equilibrium?



M31 GCs, Veljanoski et al. 2013

- What tracers are in equilibrium?
  - **Globular clusters?**
  - Satellite galaxies?
  - Stars?
- How well do we know  $\beta$ ?
- How well do we know  $v$ ?

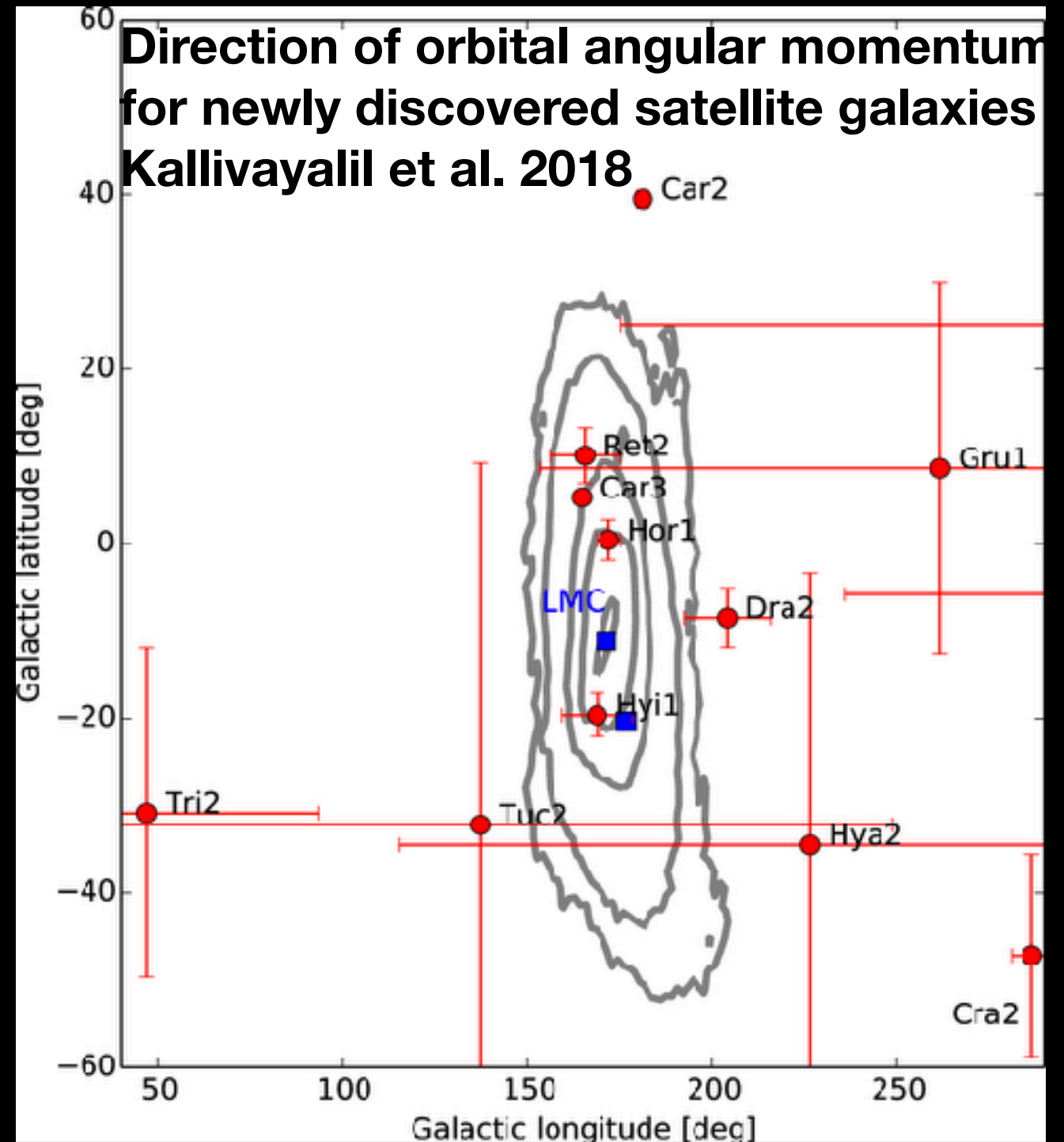
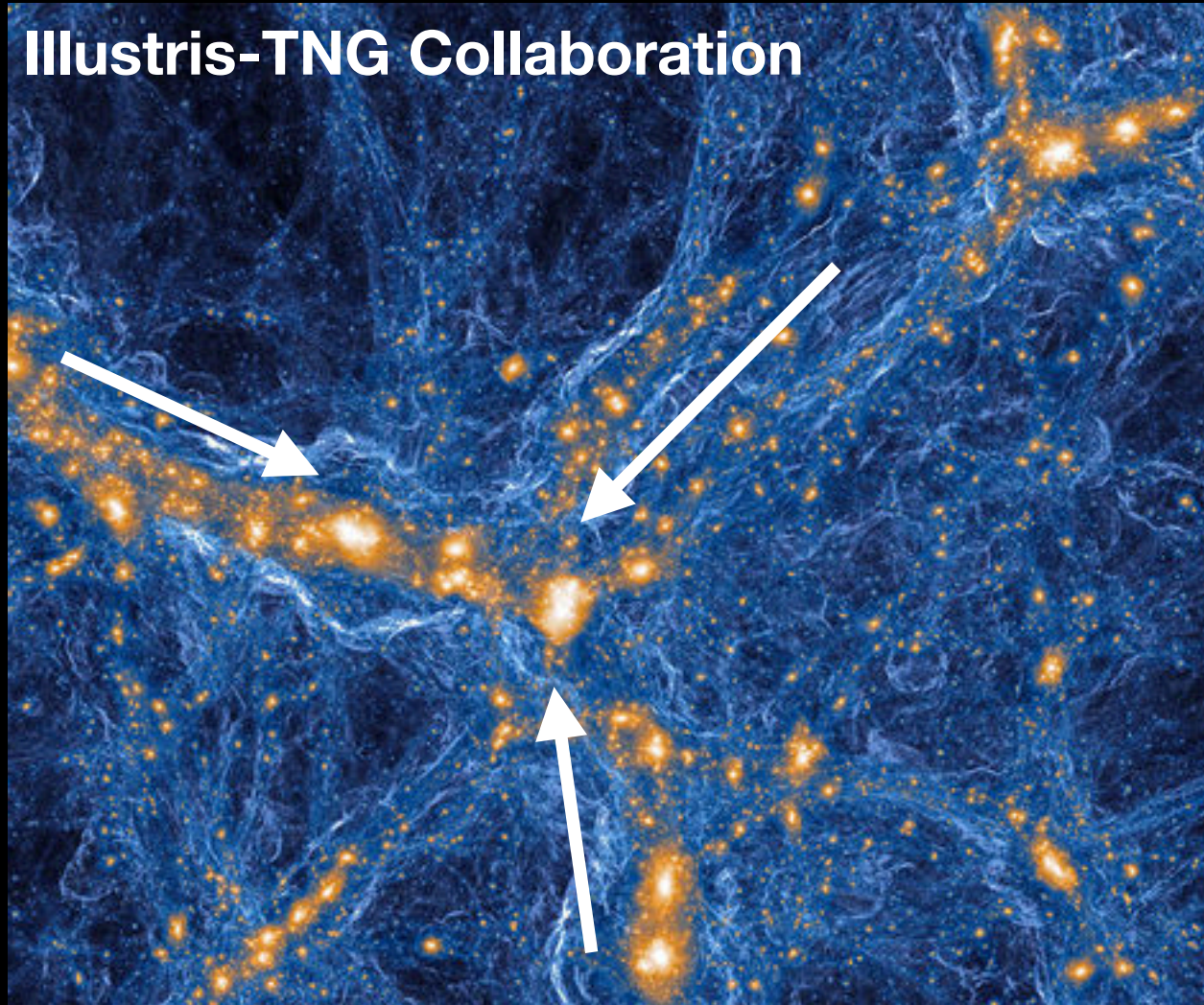
$$\frac{d(\nu \overline{v_r^2})}{dr} + 2\frac{\beta}{r} \nu \overline{v_r^2} = -\nu \frac{d\Phi}{dr}$$



# Jeans analysis - what is in equilibrium?

$$\frac{d(\nu \overline{v_r^2})}{dr} + 2\frac{\beta}{r} \nu \overline{v_r^2} = -\nu \frac{d\Phi}{dr}$$

Illustris-TNG Collaboration



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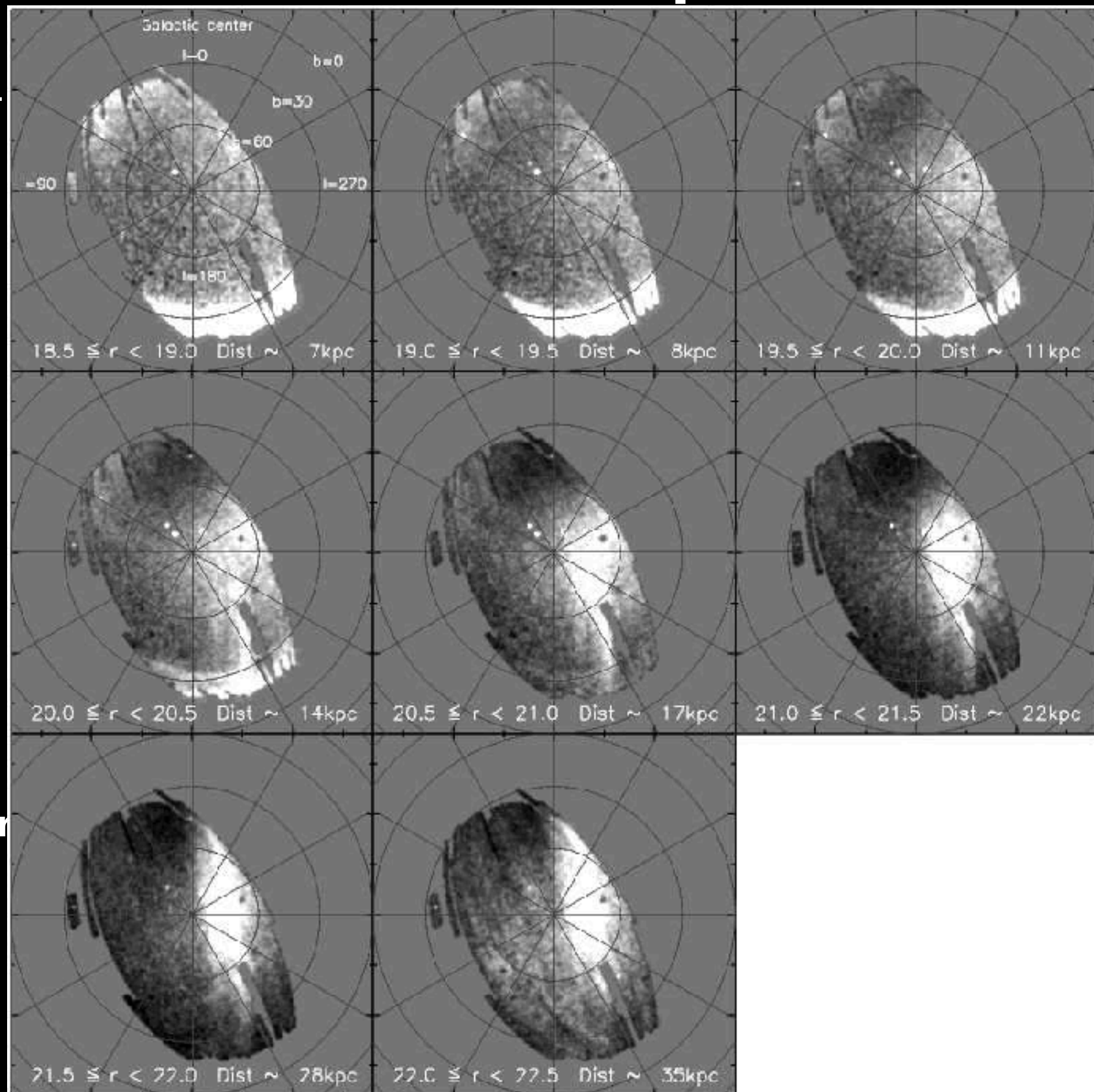


# Jeans analysis - what is in equilibrium?

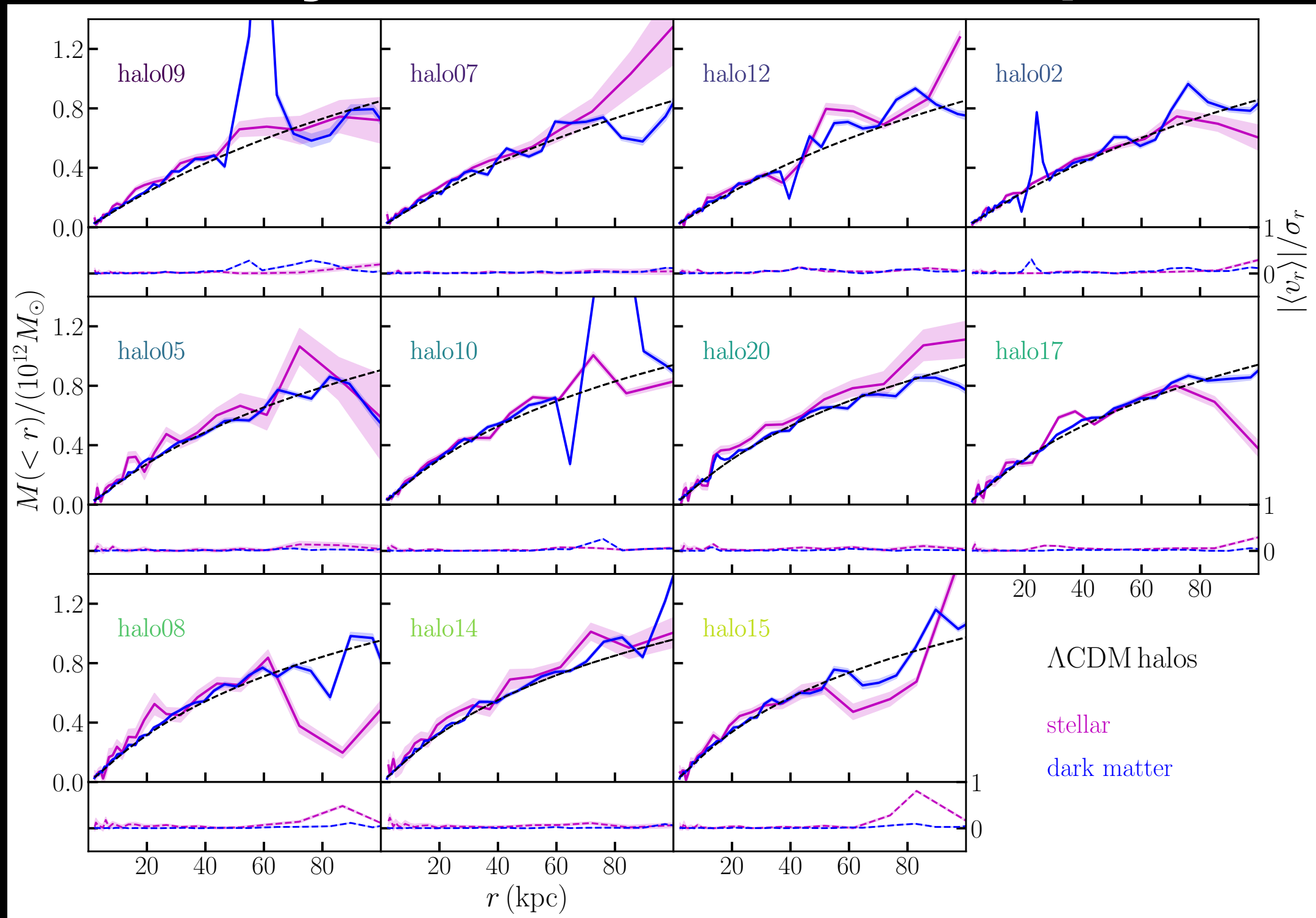
$$\frac{d(\nu \overline{v_r^2})}{dr} + 2\frac{\beta}{r} \nu \overline{v_r^2} = -\nu \frac{d\Phi}{dr}$$

**SDSS view of  
stellar halo at  
different distances:  
density-smooth model  
(Bell et al. 2008)**

- What tracers are in equilibrium?
  - Globular clusters?
  - Satellite galaxies?
  - **Stars?**
- How well do we know  $\beta$ ?
- How well do we know  $v$ ?



# Jeans analysis - what is in equilibrium?



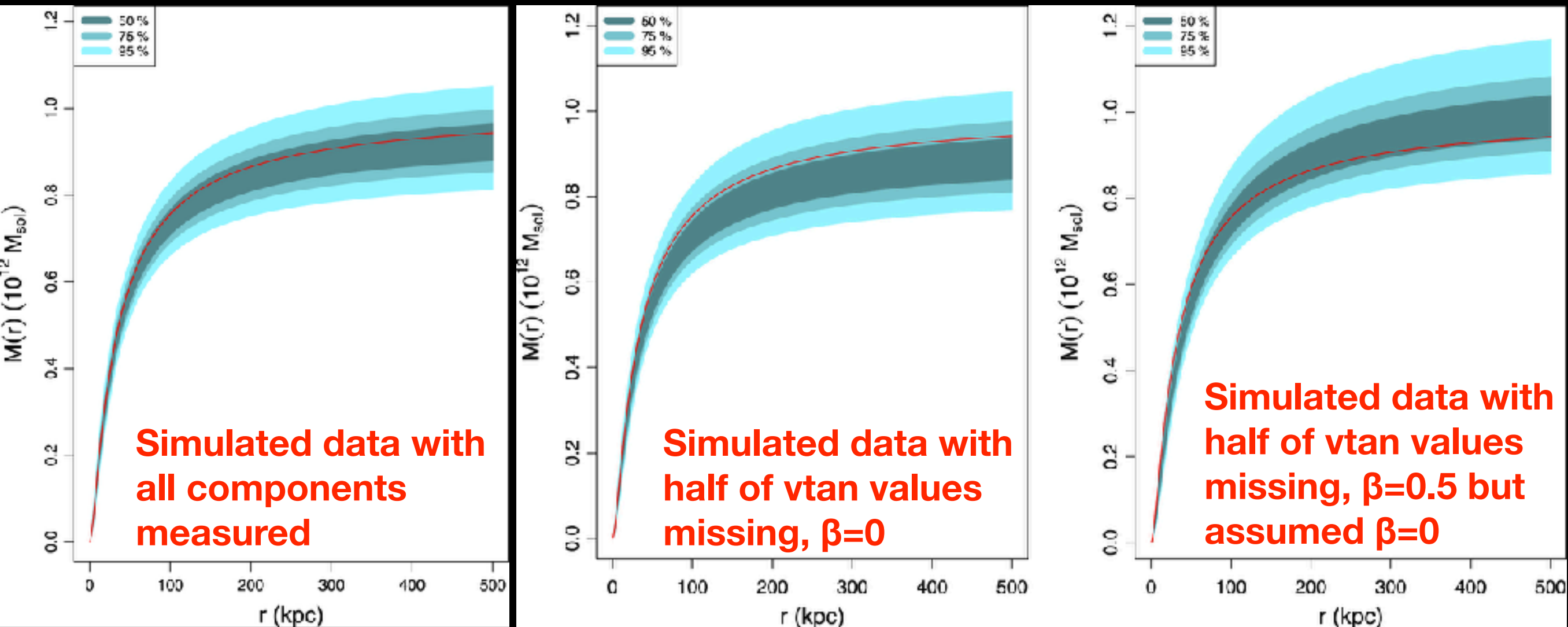
Kafle et al. 2018

- What tracers are in equilibrium?
  - Globular clusters?
  - Satellite galaxies?
  - **Stars?**

$$\frac{d(\nu \overline{v_r^2})}{dr} + 2 \frac{\beta}{r} \nu \overline{v_r^2} = - \nu \frac{d\Phi}{dr}$$

# Jeans analysis - the mass-anisotropy degeneracy

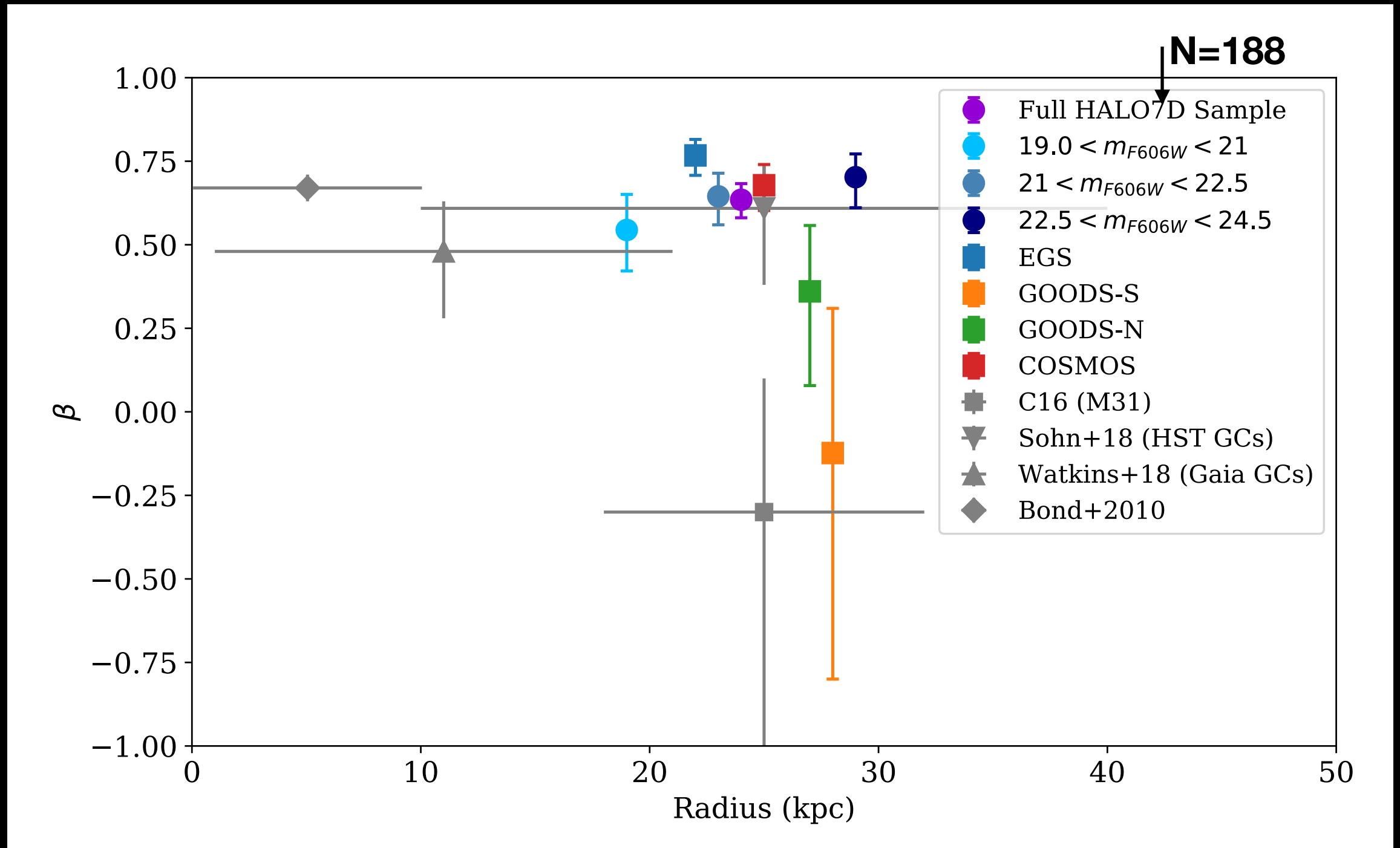
$$\frac{d(\nu \overline{v_r^2})}{dr} + 2\frac{\beta}{r} \nu \overline{v_r^2} = -\nu \frac{d\Phi}{dr}$$



- What tracers are in equilibrium?
  - Globular clusters?
  - Satellite galaxies?
- How well do we know  $\beta$ ?
- How well do we know  $v$ ?

Eadie & Harris 2017

# Jeans analysis - the mass-anisotropy degeneracy



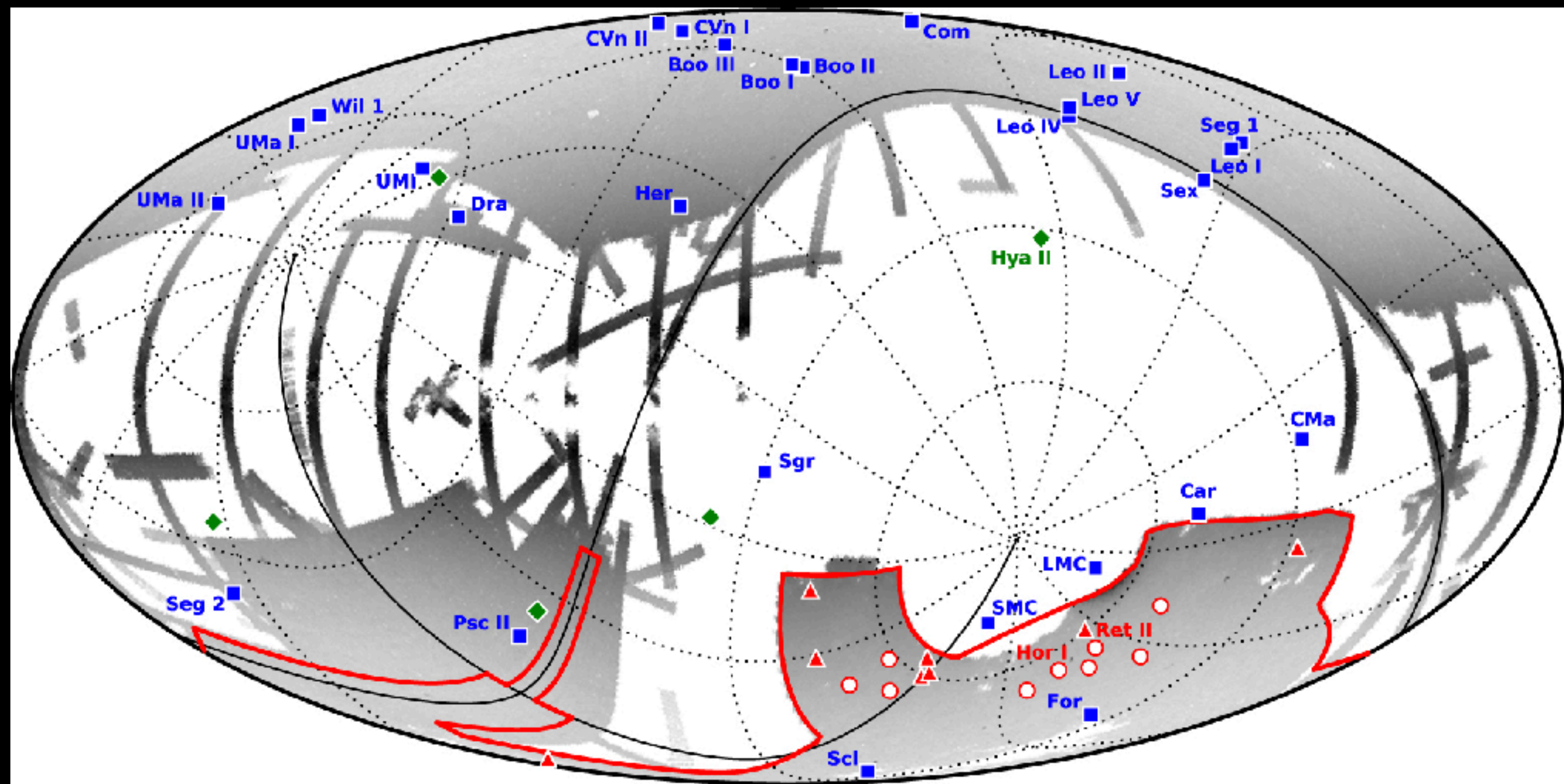
Cunningham et al. 2019

- What tracers are in equilibrium?
- Globular clusters?
- Satellite galaxies?
- **How well do we know  $\beta$ ?**
- **How well do we know  $v$ ?**

$$\frac{d(\nu \overline{v_r^2})}{dr} + 2 \frac{\beta}{r} \nu \overline{v_r^2} = - \nu \frac{d\Phi}{dr}$$



# Jeans analysis - the selection function

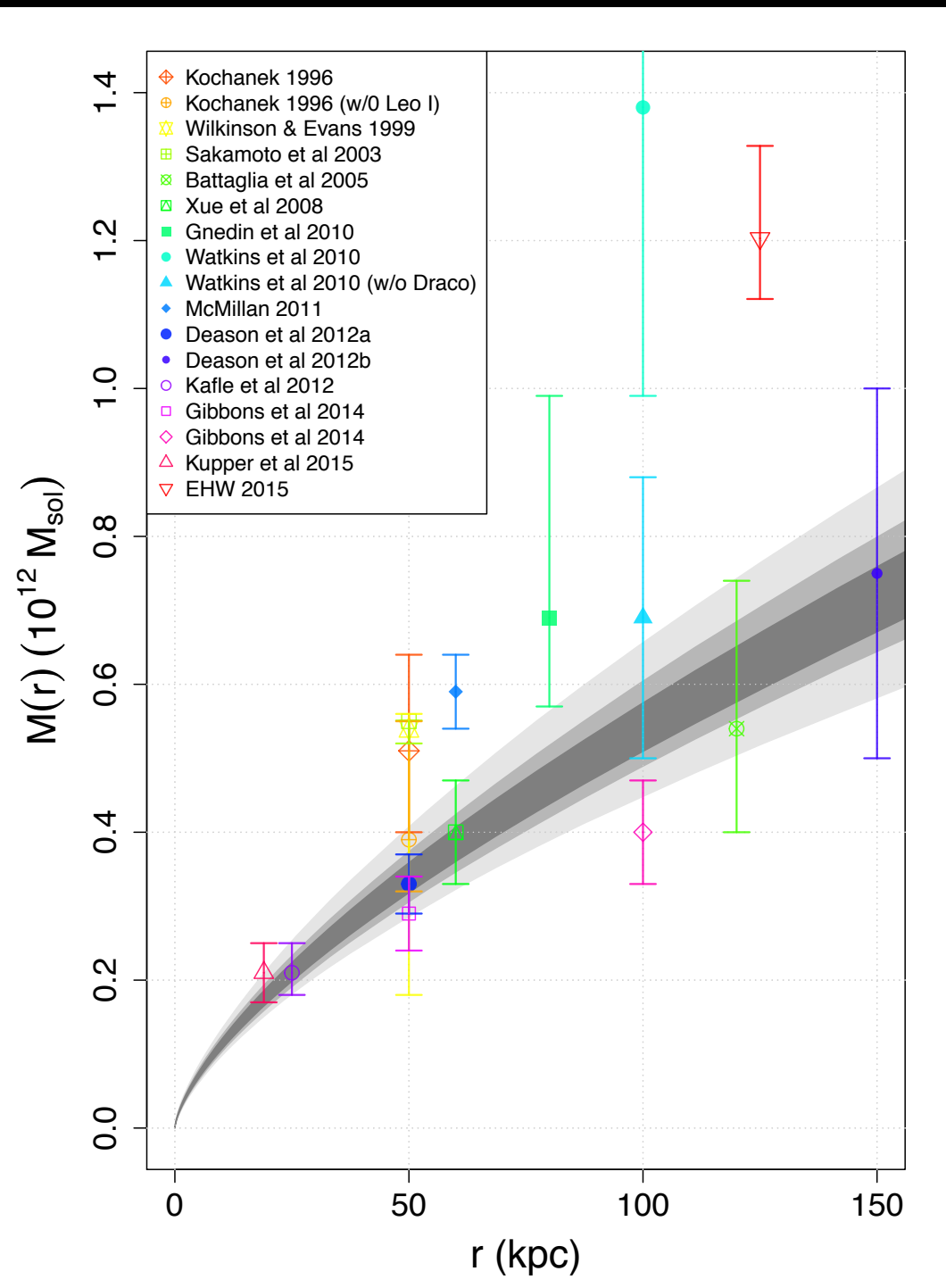


- What tracers are in equilibrium?
  - Globular clusters?
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- How well do we know  $\beta$ ?
- **How well do we know  $v$ ?**

$$\frac{d(\nu \overline{v_r^2})}{dr} + 2\frac{\beta}{r}\nu \overline{v_r^2} = -\nu \frac{d\Phi}{dr}$$

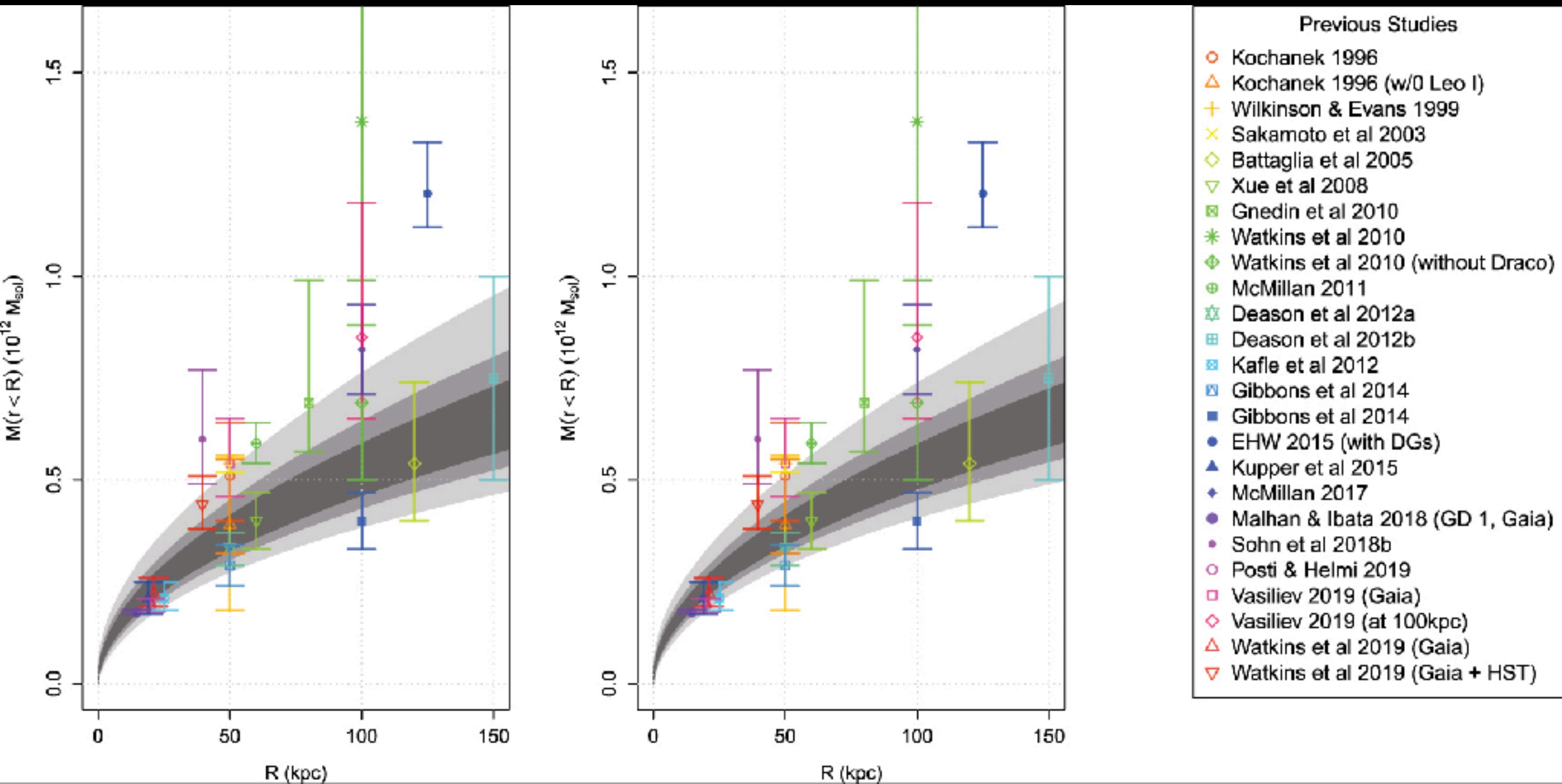
Galactic positions of known satellite galaxies + surveyed regions of sky (as of 2015)  
 Drlica-Wagner et al. 2015  
 (DES collab)

# example of Jeans analysis **before** & after Gaia

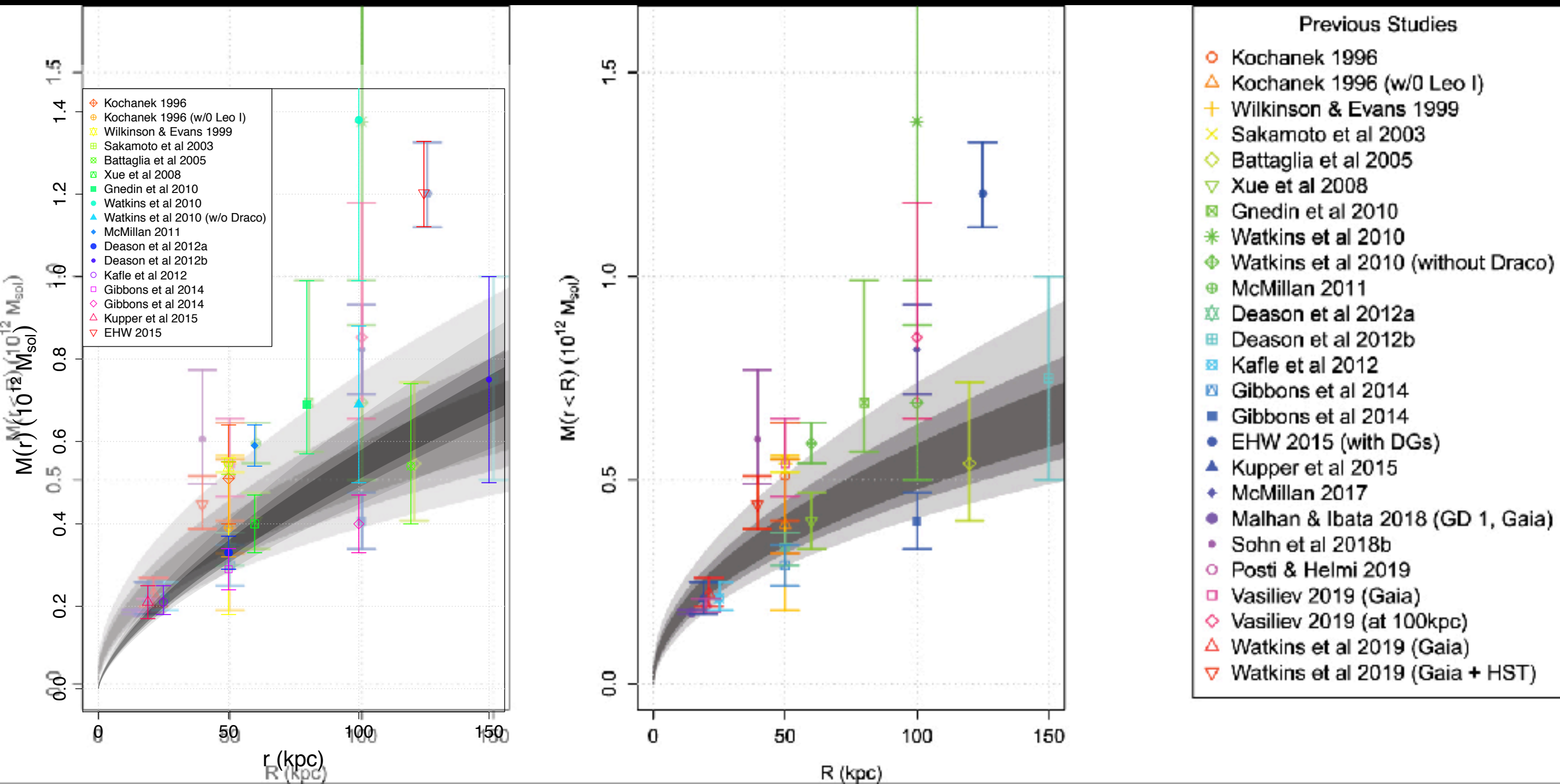




# example of Jeans analysis before & after Gaia



# example of Jeans analysis before & after Gaia



# Stream models: non-equilibrium mass estimation

## some key scaling relations

dynamical time  $\Omega = \sqrt{\frac{GM}{R_0^3}} \quad t_{\text{dyn}} = \frac{2\pi}{\Omega}$

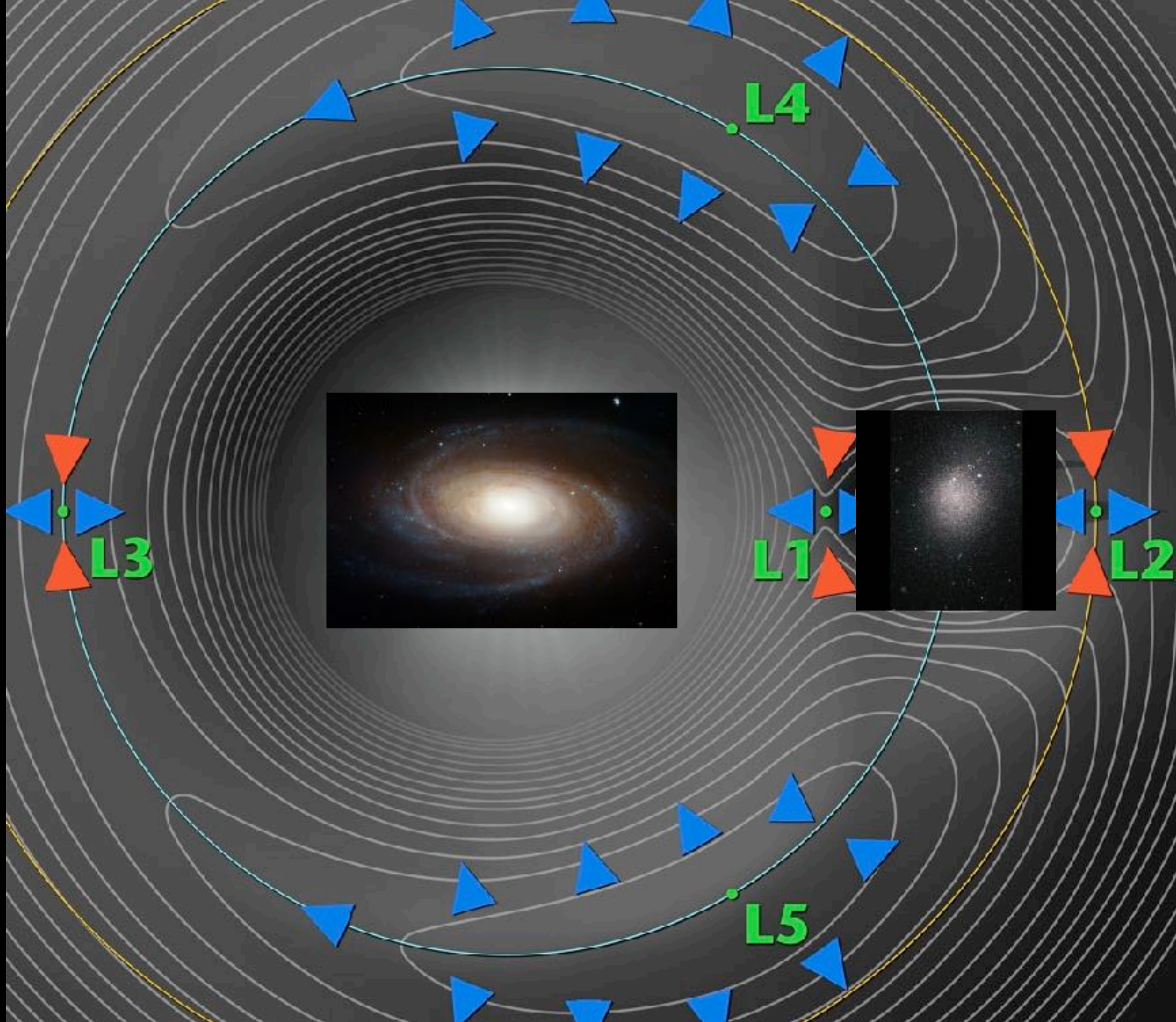
At 10 kpc:  $t \sim 300$  Myr  
At 100 kpc:  $t \sim 3$  Gyr

Tidal (Hill) radius [based on 3-body approximation]  $r_t = \left(\frac{m}{3M}\right)^{1/3} R_0$

initial phase-space distribution  $\frac{r_t}{R_0} \sim \left(\frac{m}{M}\right)^{1/3} \sim \frac{\sigma}{v_{\text{orb}}} \quad \frac{\delta E}{E_{\text{orb}}} \sim \left(\frac{m}{M}\right)^{1/3}$

See also Johnston 1998, Johnston et al. 1999

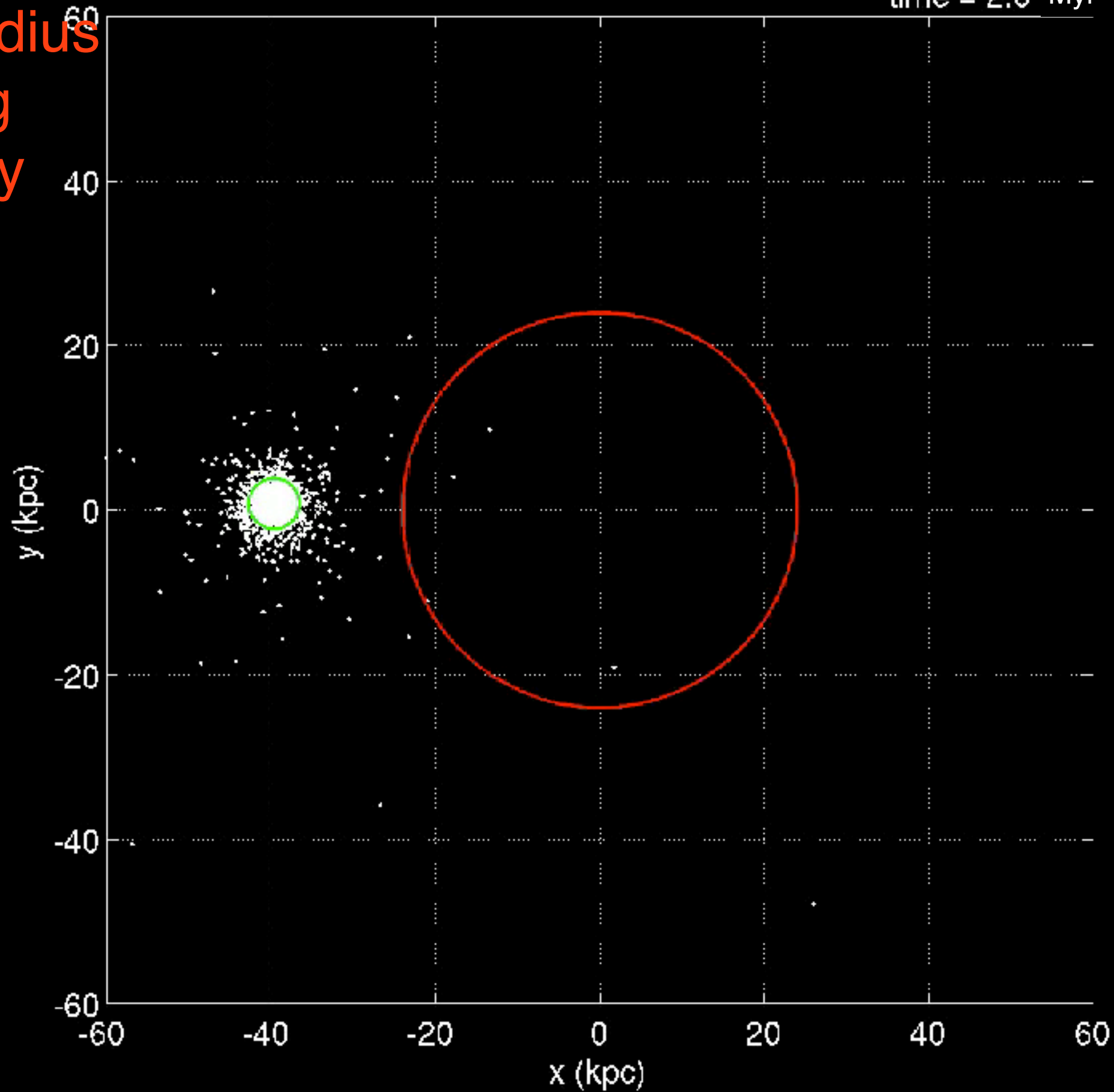




time = 2.0 Myr

Scale radius  
of big  
galaxy

Hill radius  
of small  
galaxy

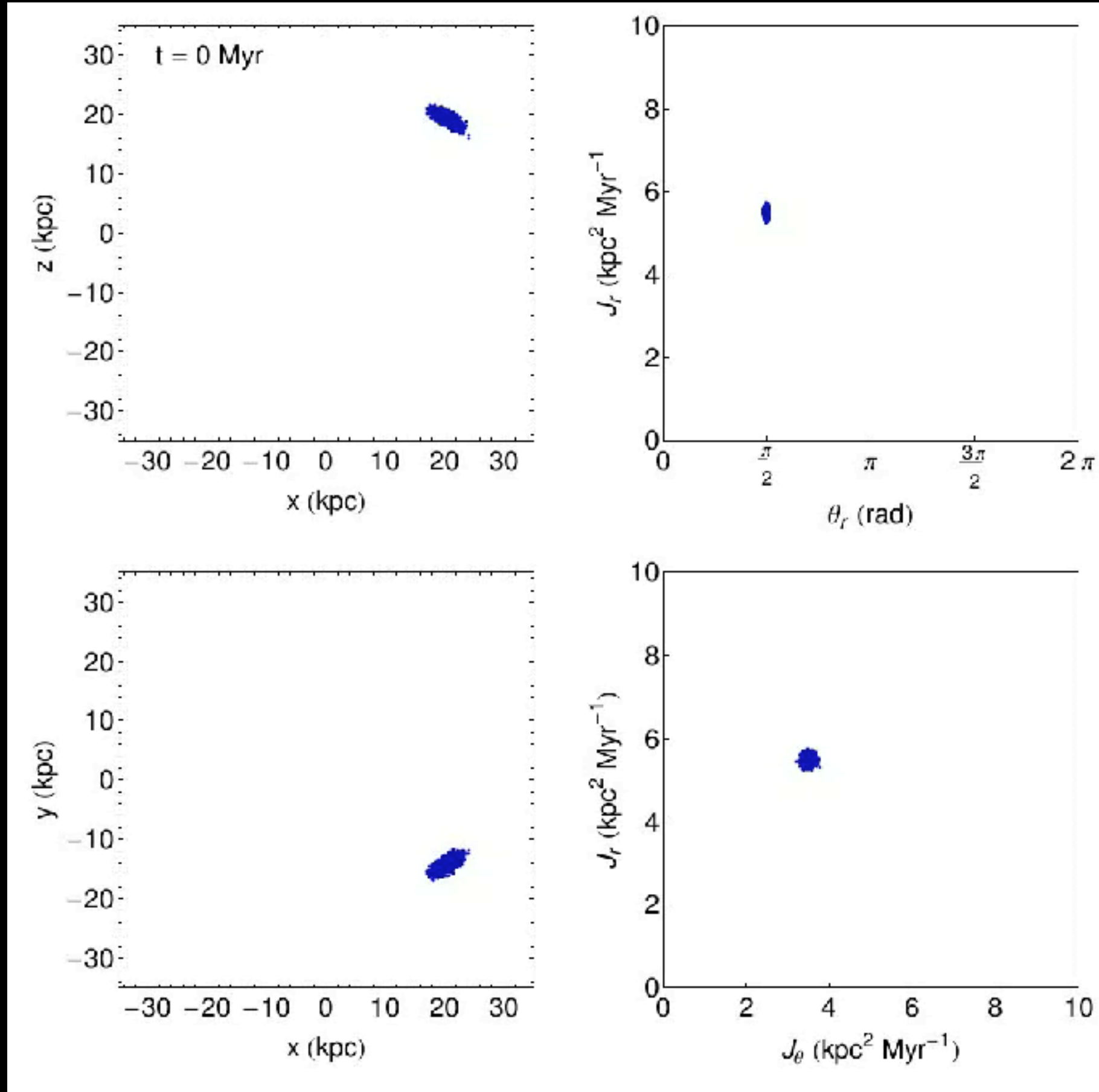


# Review of action-angle variables

$$(p, q) \leftrightarrow (J, \theta)$$

$$J = \oint p \, dq$$

$$\theta(t) = \Omega t + \theta_0$$





# Stream models: non-equilibrium mass estimation

$$r_t = \left( \frac{m}{3M} \right)^{1/3} R_0 \quad \Omega = \sqrt{\frac{GM}{R_0^3}} \quad t_{\text{dyn}} = \frac{2\pi}{\Omega} \sim T_{\text{orb}}$$

$$\frac{r_t}{R_0} \sim \left( \frac{m}{M} \right)^{1/3} \sim \frac{\sigma}{v_{\text{orb}}} \quad \frac{\delta E}{E_{\text{orb}}} \sim \left( \frac{m}{M} \right)^{1/3}$$

scaling of length and width with time

phase-wrapping time  $\delta\theta_i(t) \sim 2\pi$

phase-mixing time  $\delta\theta_i(t) \sim 2\pi N_*$

$$\frac{\delta J}{J} \delta\theta_0 \sim \left( \frac{m}{M} \right)^{1/3}$$

$$\delta\theta_i(t \gg t_0) = \frac{\partial^2 H}{\partial J_i \partial J_j} \delta J_j t$$

See also Johnston 1998, Helmi & White 1999

# Stream models: non-equilibrium mass estimation

scaling of length and width with time

in a spherical logarithmic potential,

$$\Phi = v_c^2 \ln(r) + \Phi_0$$

$$T_{\text{orb}}(E + \delta E) = \exp\left(\frac{\delta E}{v_c^2}\right)$$

phase-wrapping time  $\delta\theta_i(t) \sim 2\pi$

$$T_{2\pi} = \frac{T_{\text{orb}}}{1 - \exp[-(2Gm/R_0 v_c^2)^{1/3}]}$$

phase-mixing time  $\delta\theta_i(t) \sim 2\pi N_*$

$$\frac{\delta J}{J} \delta\theta_0 \sim \left(\frac{m}{M}\right)^{1/3}$$
$$\delta\theta_i(t \gg t_0) = \frac{\partial^2 H}{\partial J_i \partial J_j} \delta J_j t$$

spreading depends on  
potential and its  
symmetries

in a spherical logarithmic potential

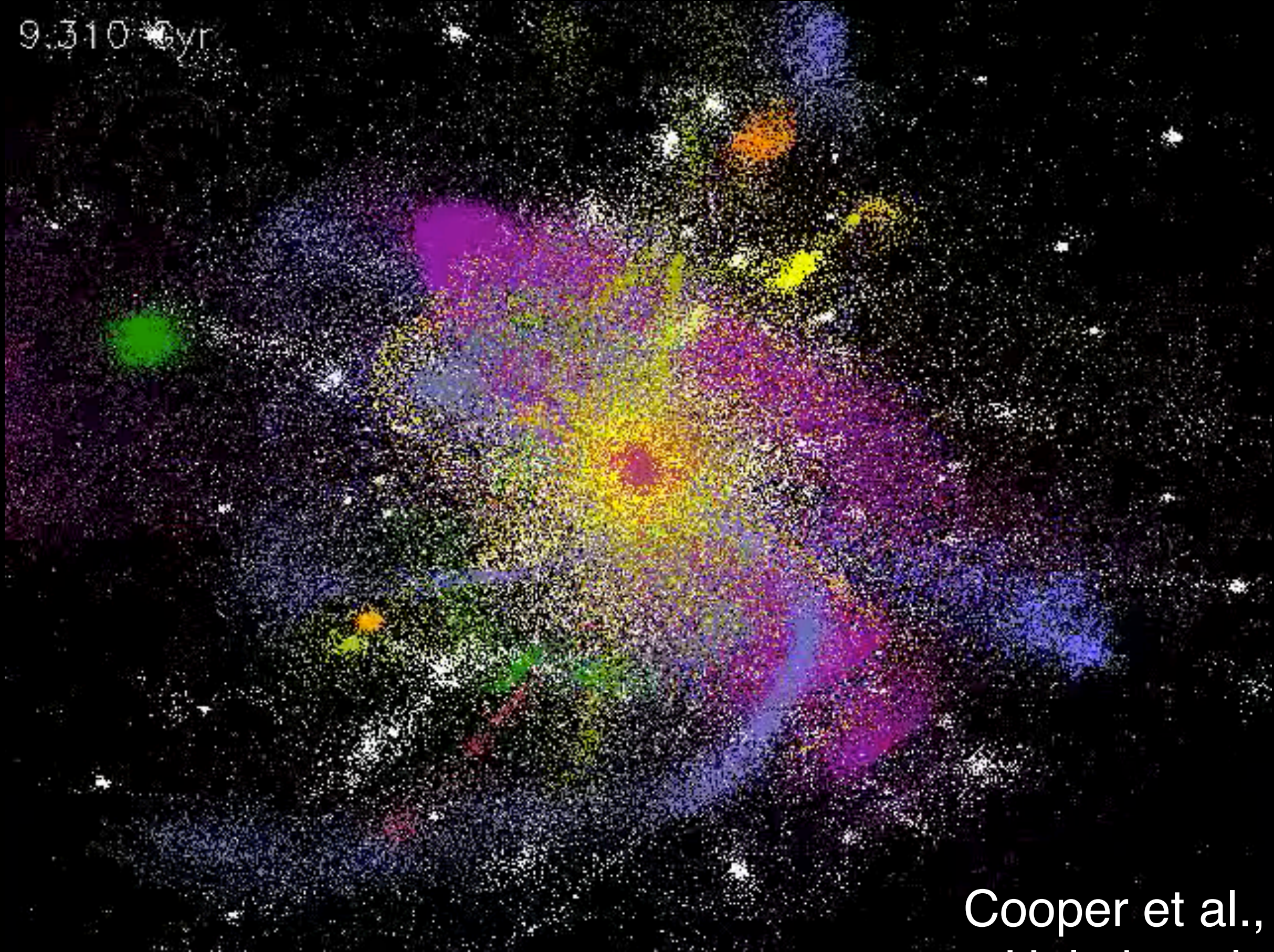
See also Johnston 1998, Helmi & White 1999



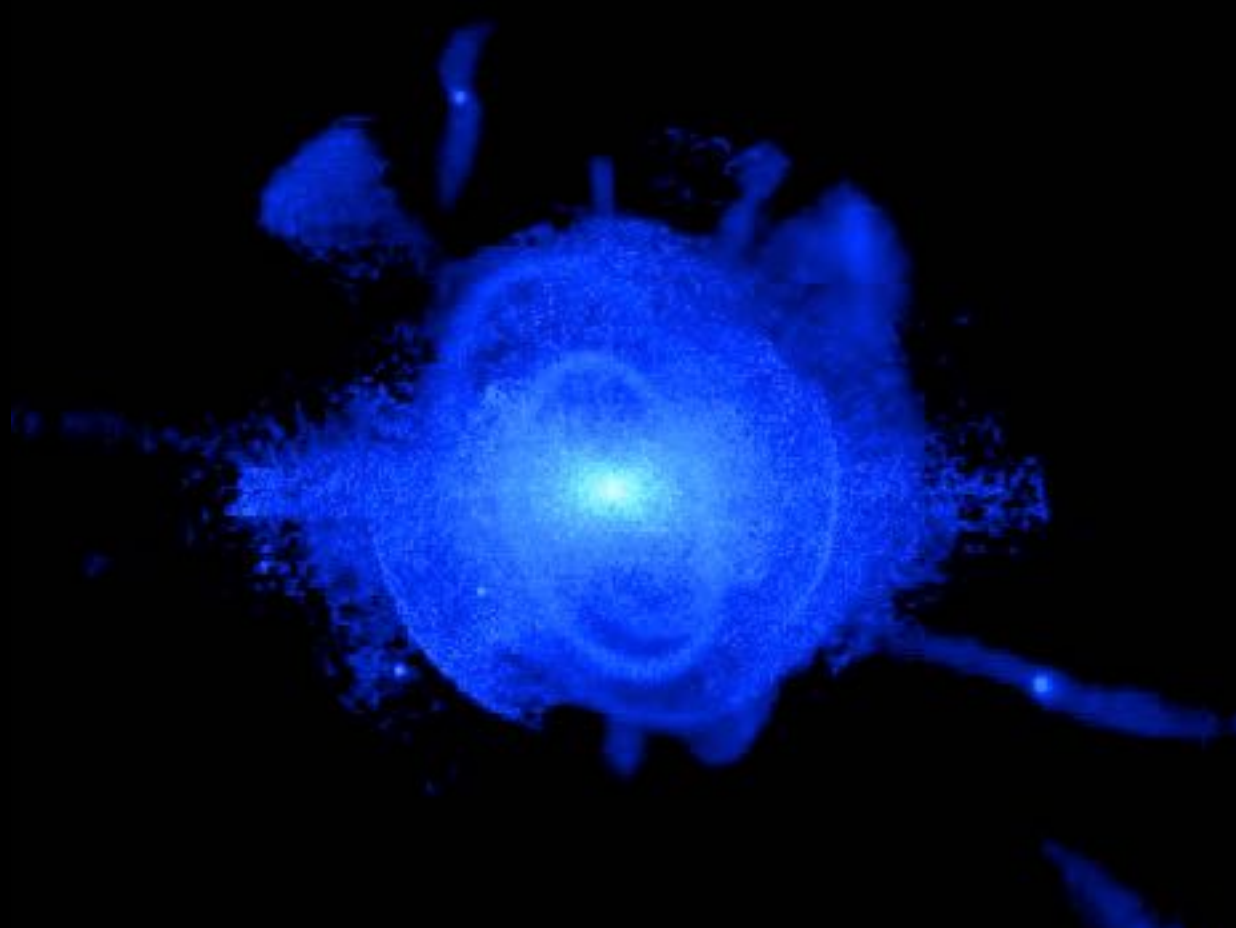
9.310 Gyr

100 kpc

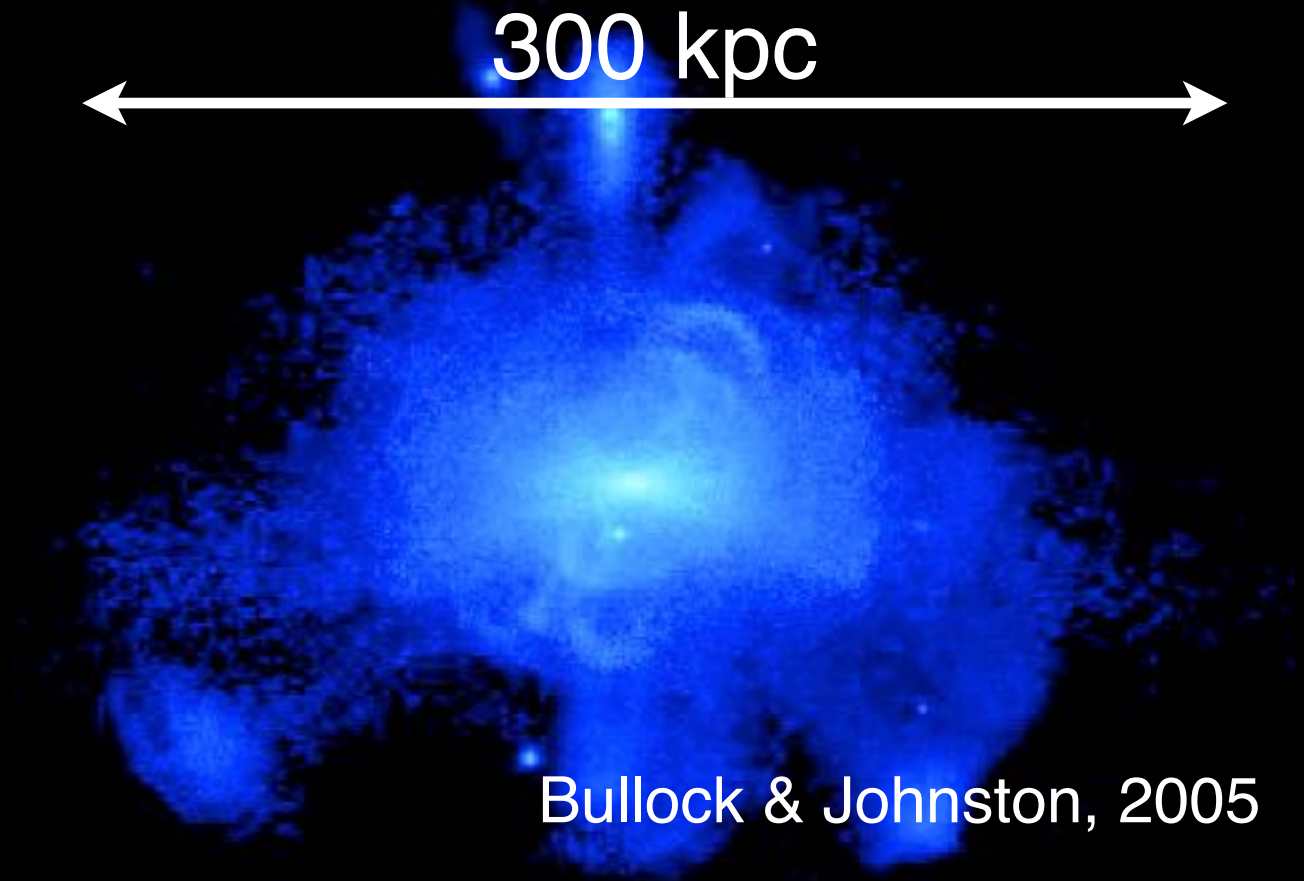
Cooper et al., 2010  
Helmi et al., 2011



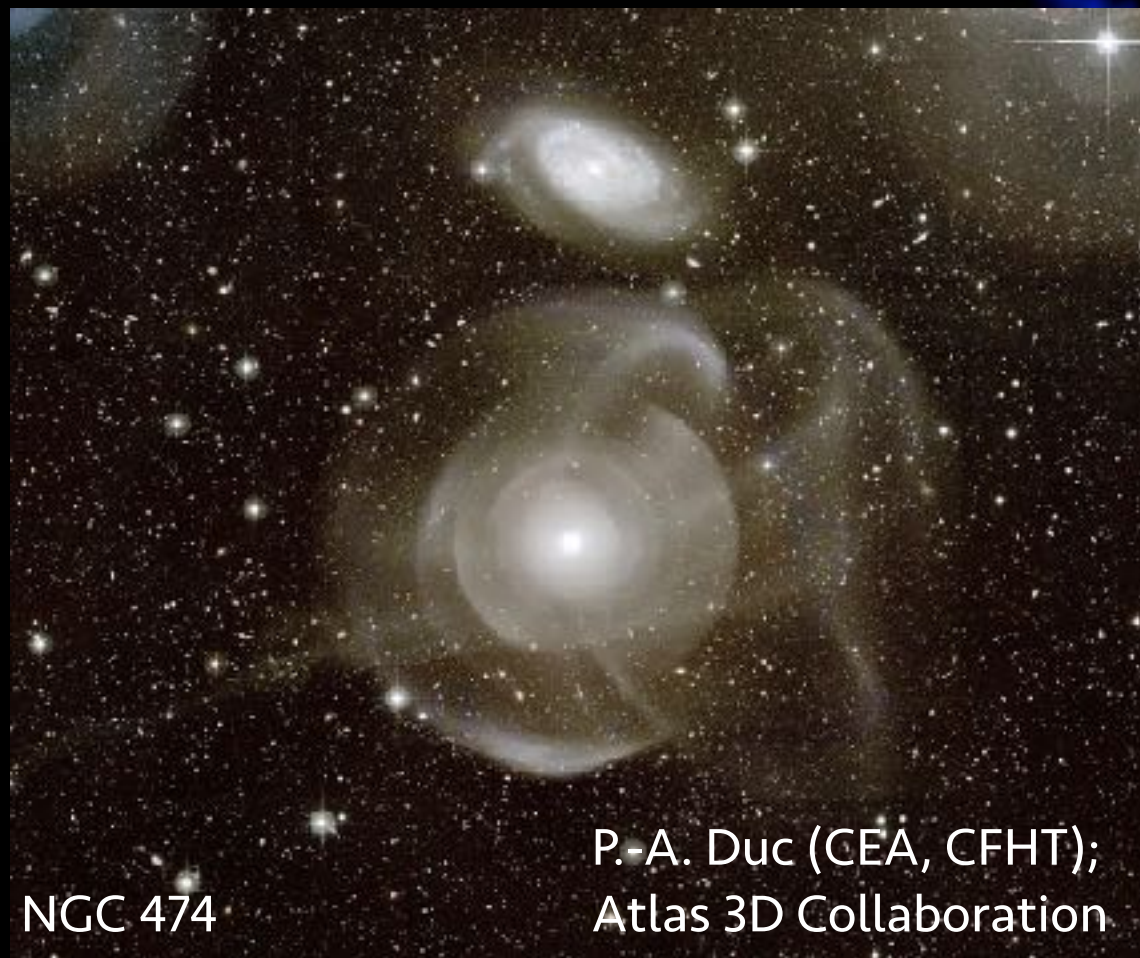




300 kpc

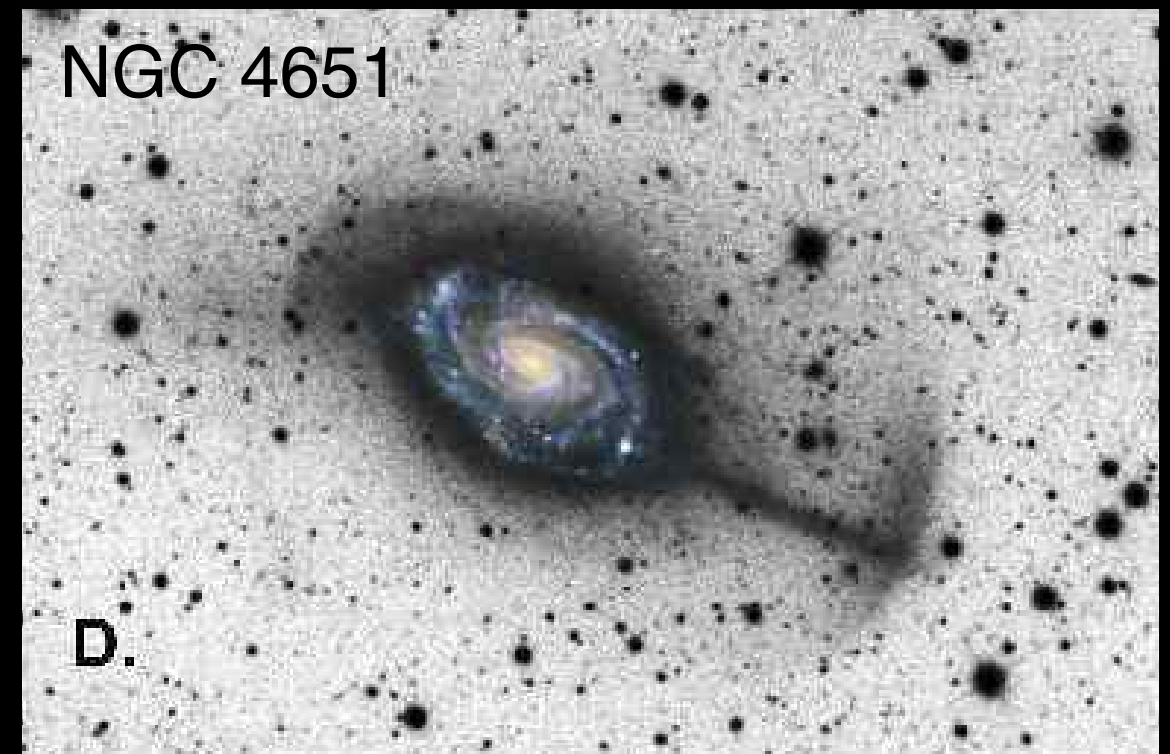


Bullock & Johnston, 2005



NGC 474

P.-A. Duc (CEA, CFHT);  
Atlas 3D Collaboration



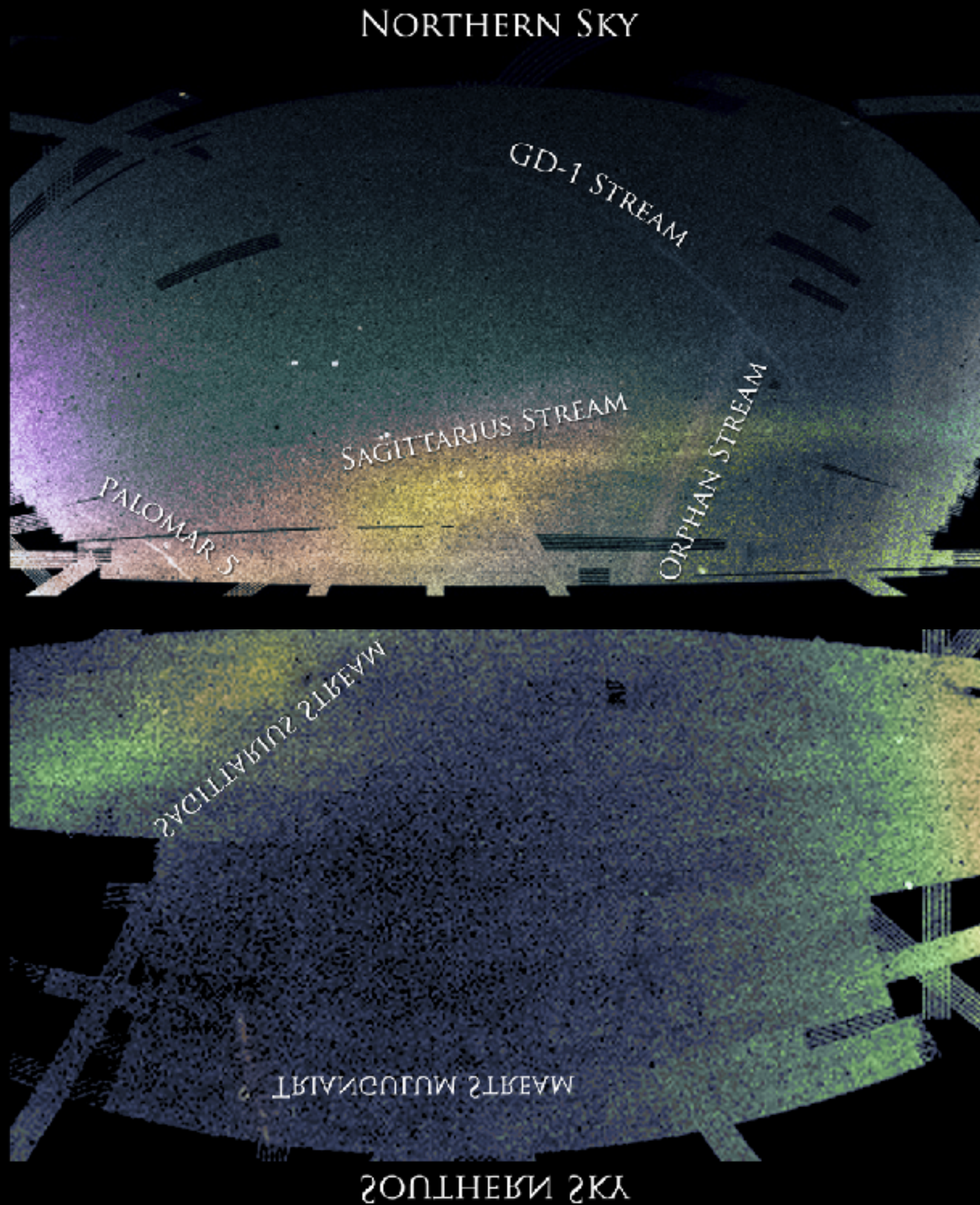
NGC 4651

D.

Martinez-Delgado et al.



We know  
about  
plenty of  
streams in  
the MW  
(20-50  
depending  
on who you  
ask!)



Bonaca, Giguère, & Geha (SDSS DR8)

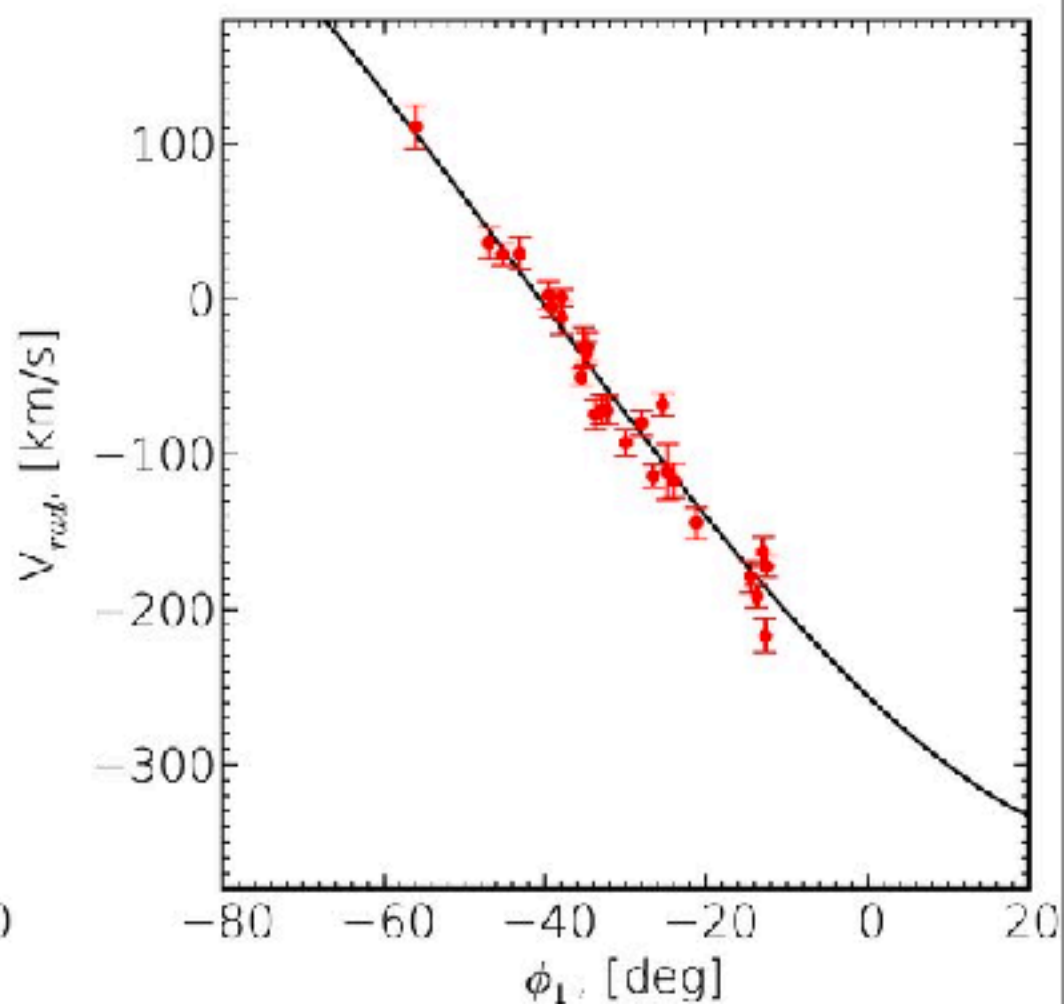
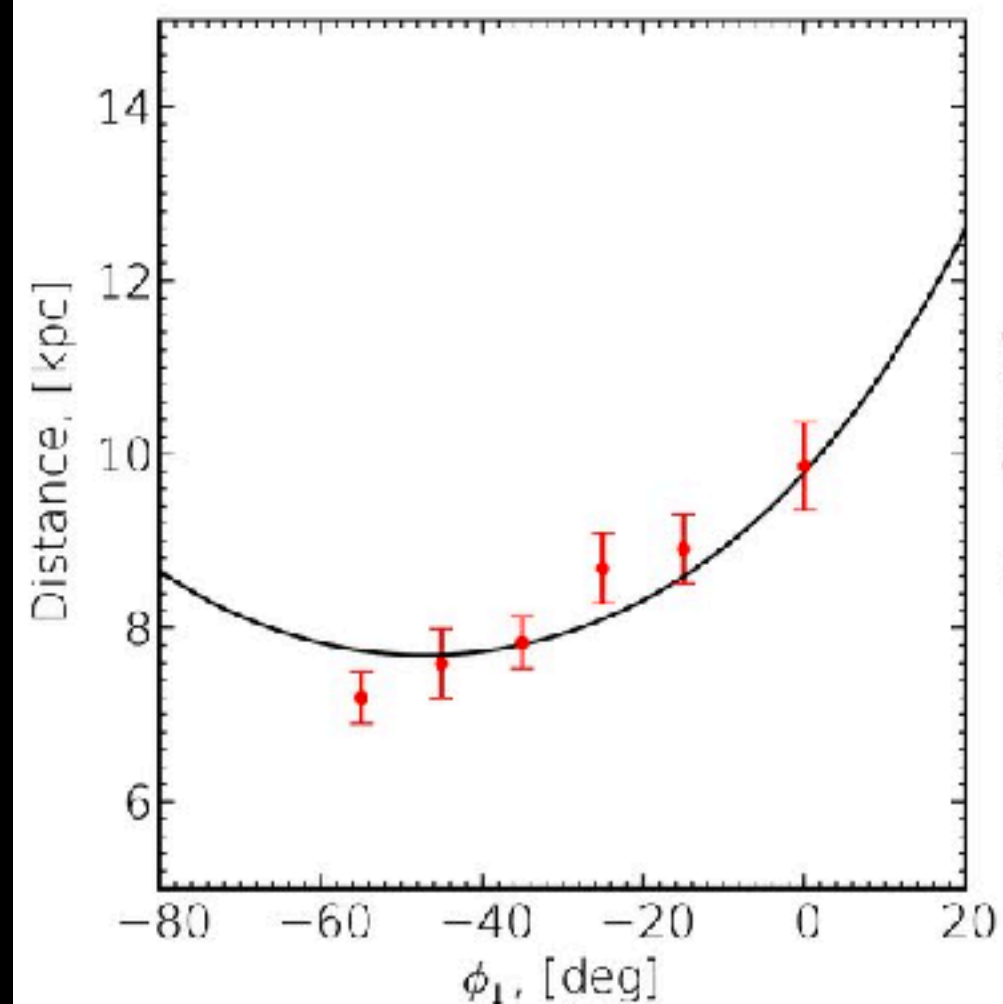
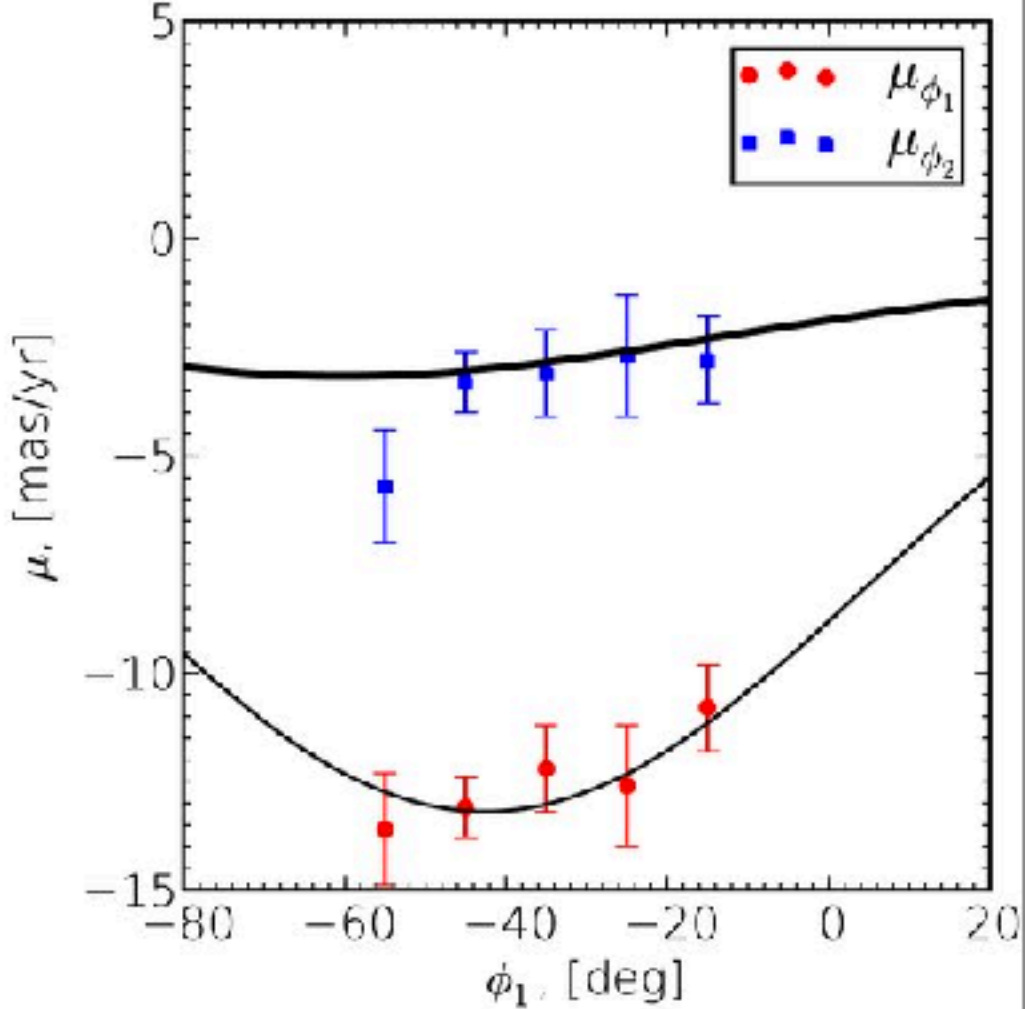
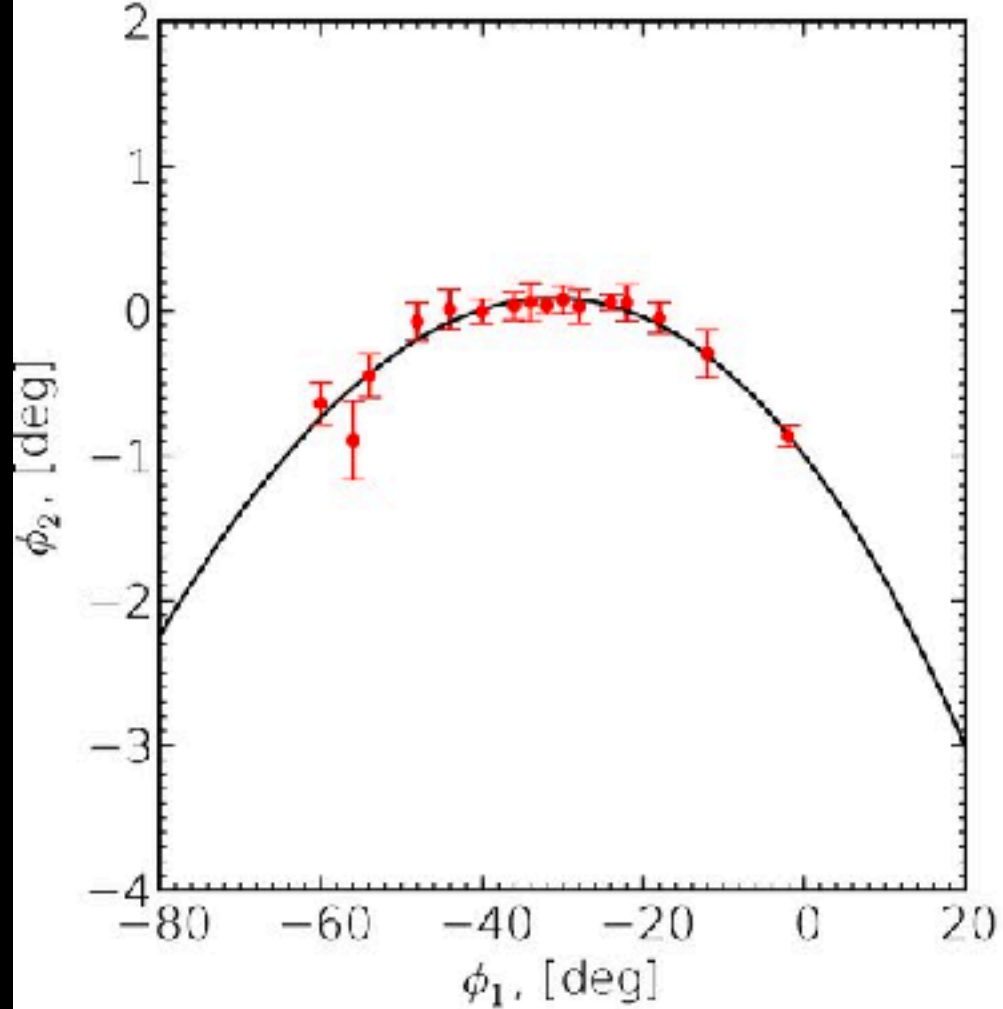
# techniques for modeling tidal streams

- Orbit integration
- Fast stream approximation
- N-body modeling
- Clustering methods

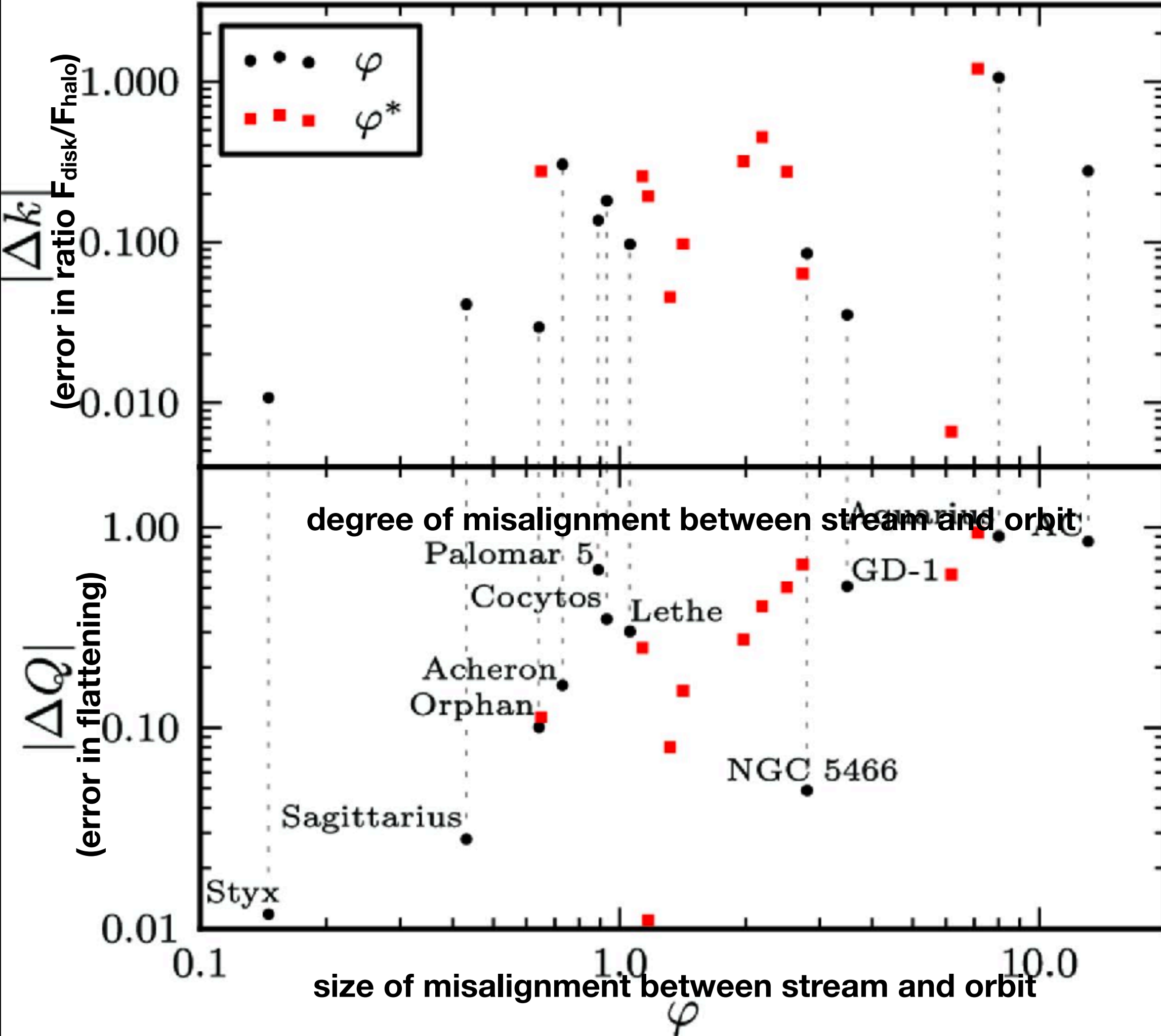


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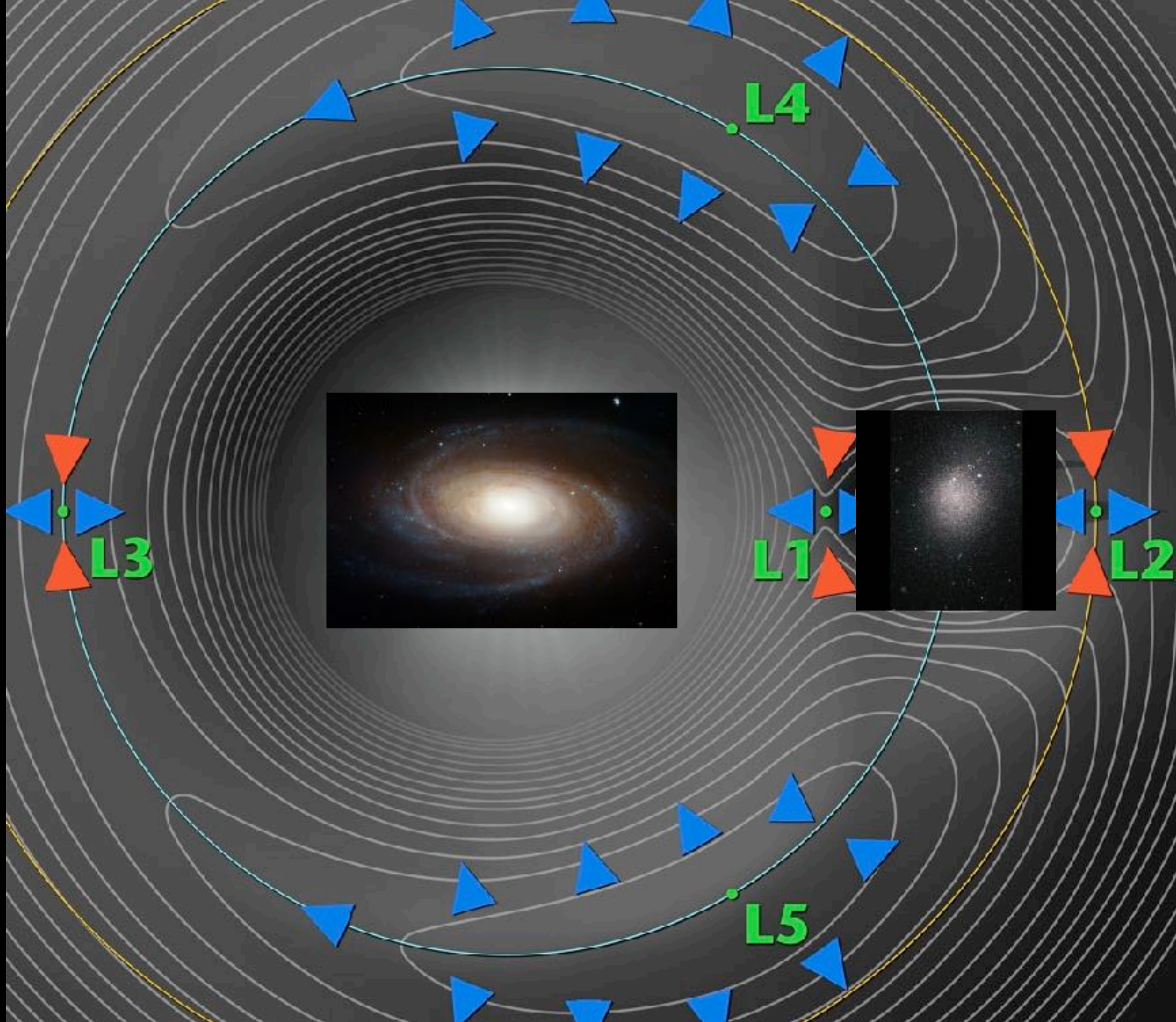
GD-1, Koposov, Rix, & Hogg 2010

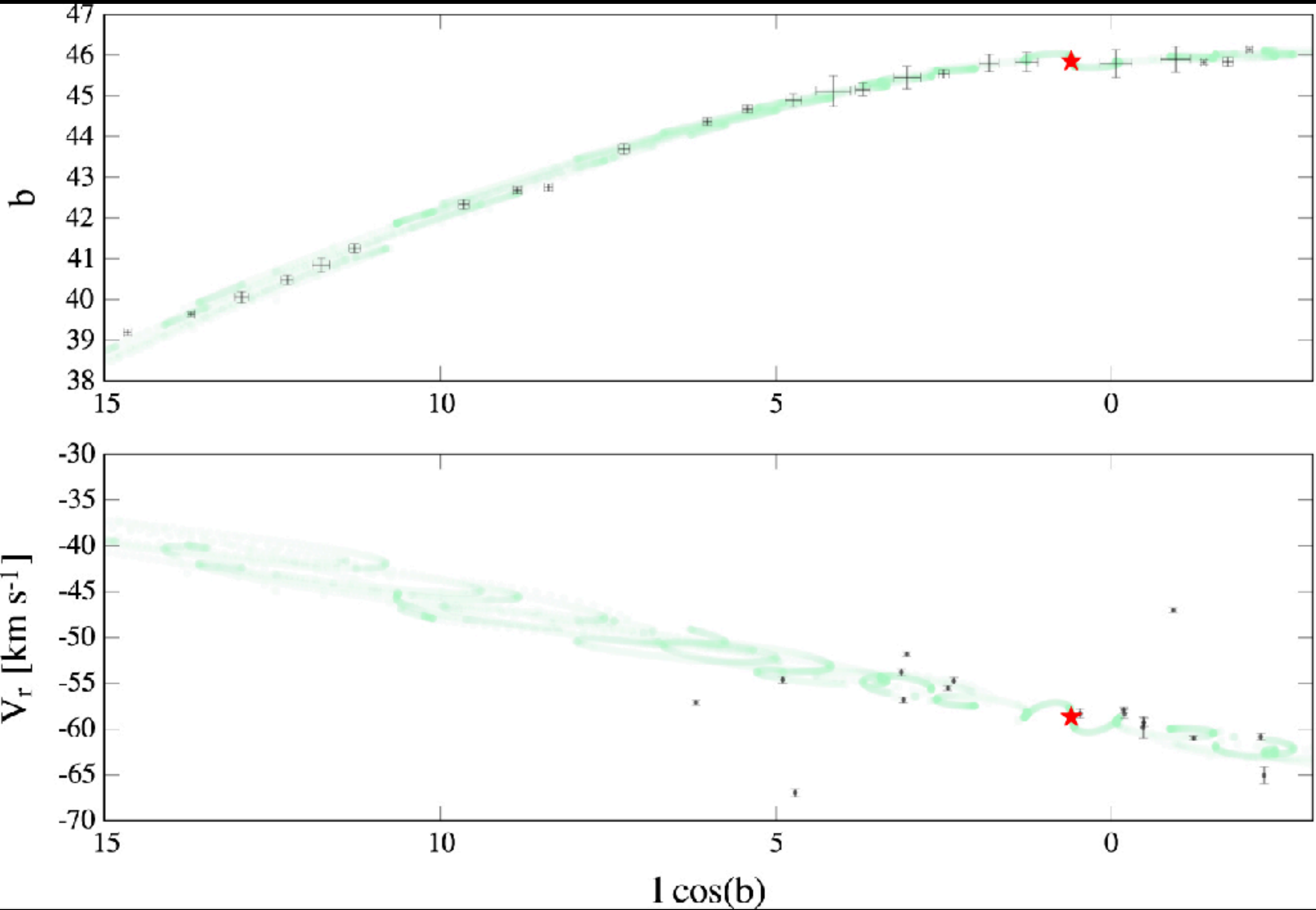


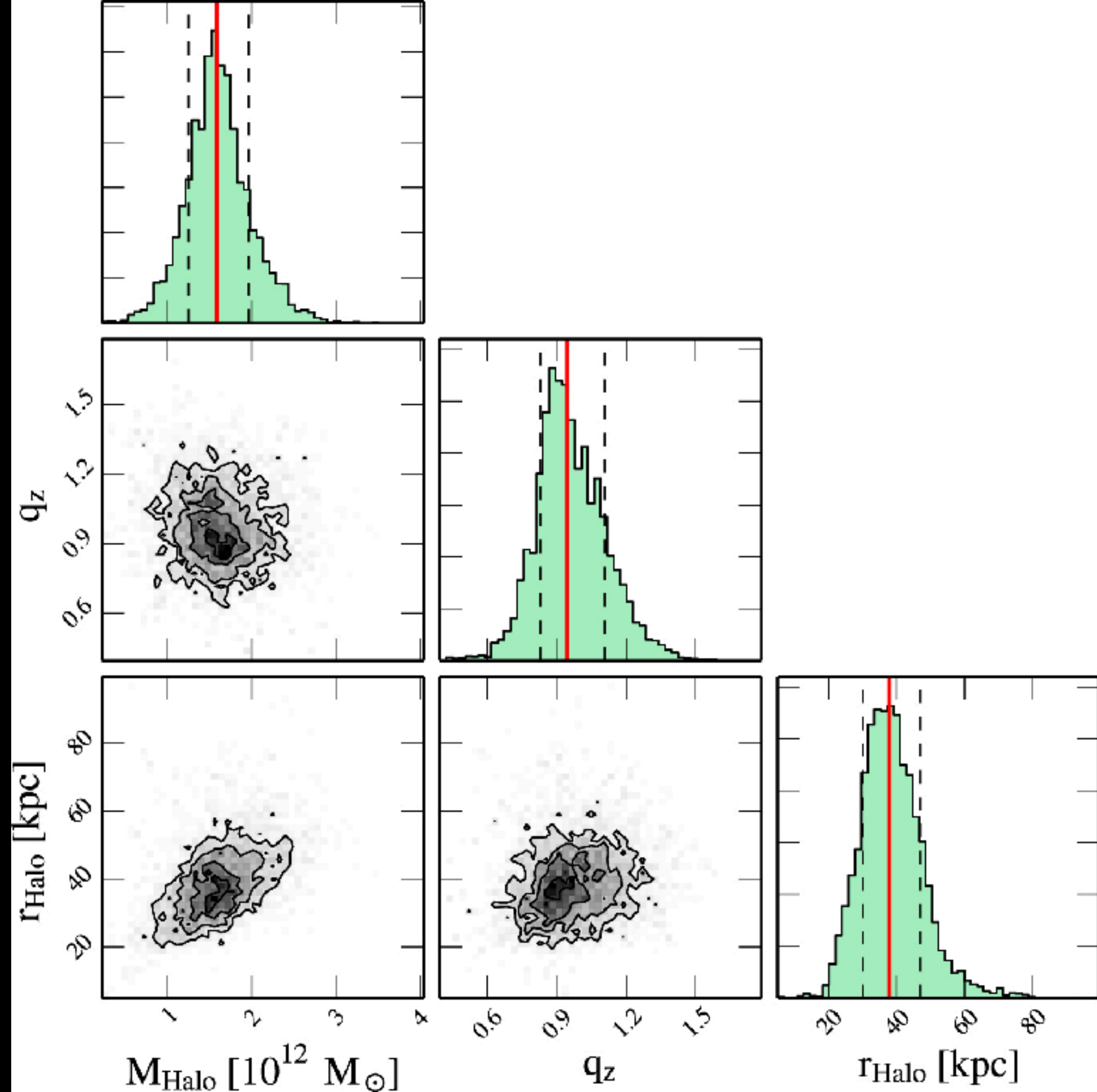
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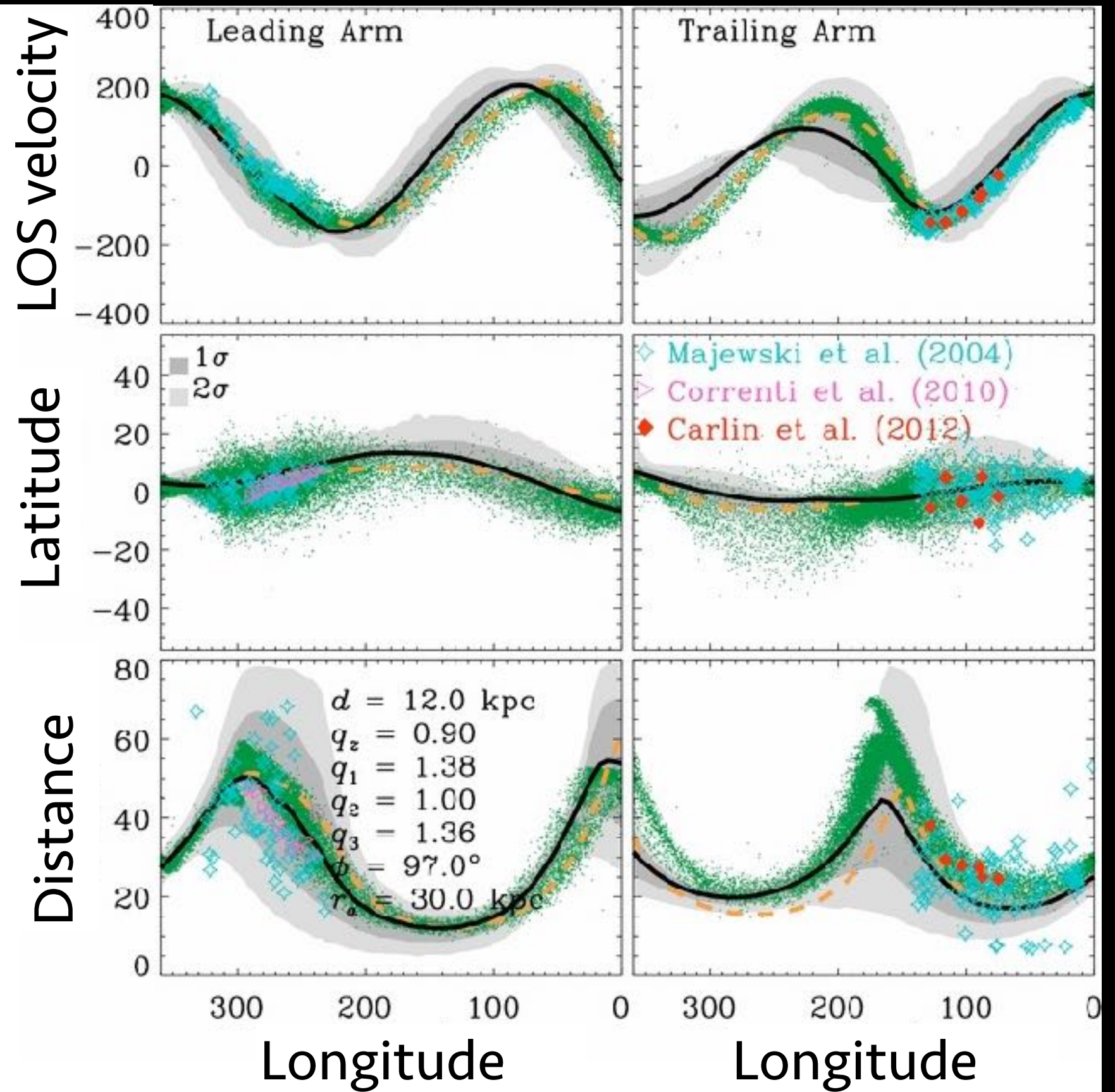


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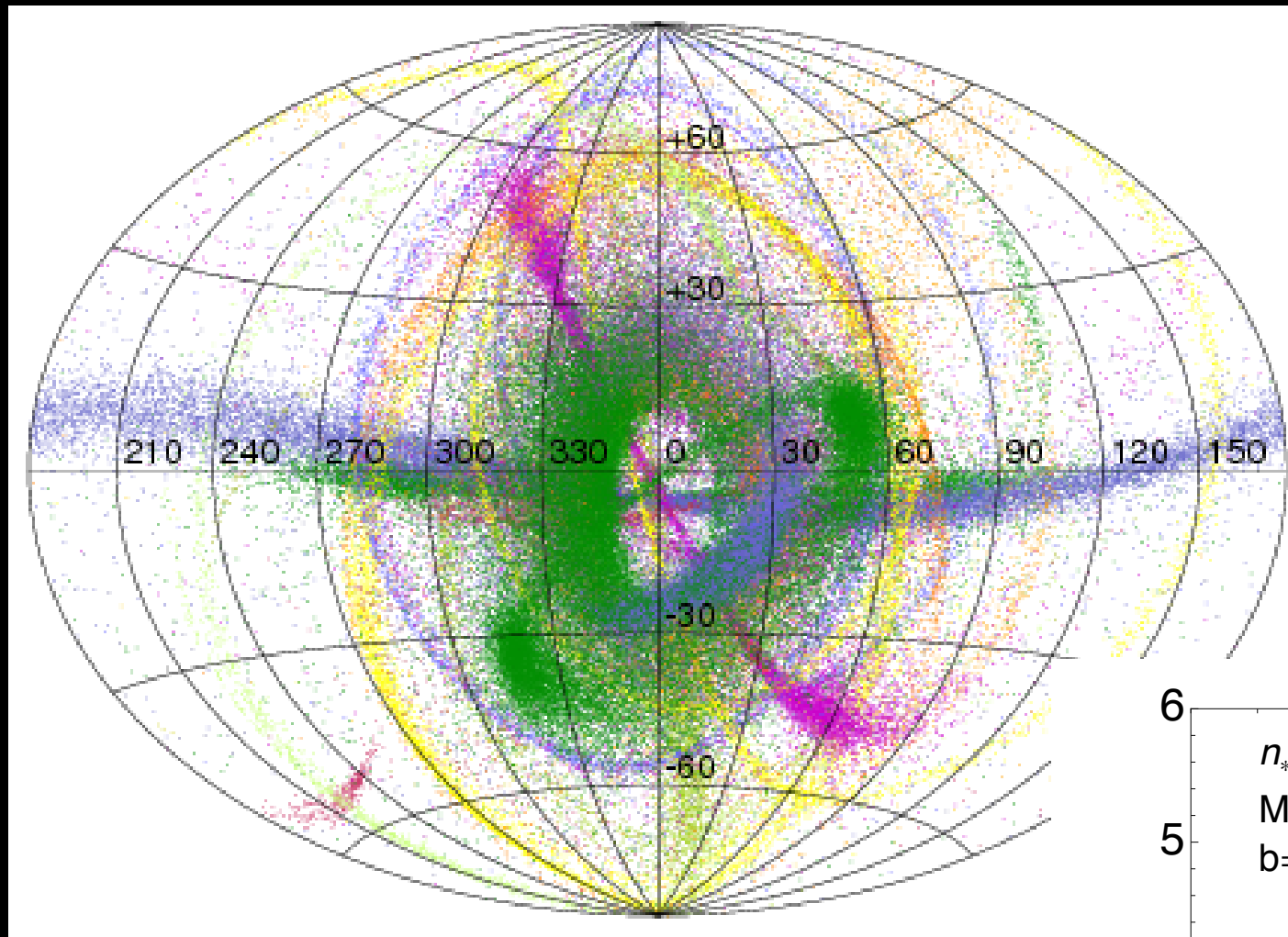
Sagittarius Stream in  
triaxial dark matter halo:  
Vera-Ciro & Helmi 2013;  
Law & Majewski 2010



# techniques for modeling tidal streams

- Orbit integration
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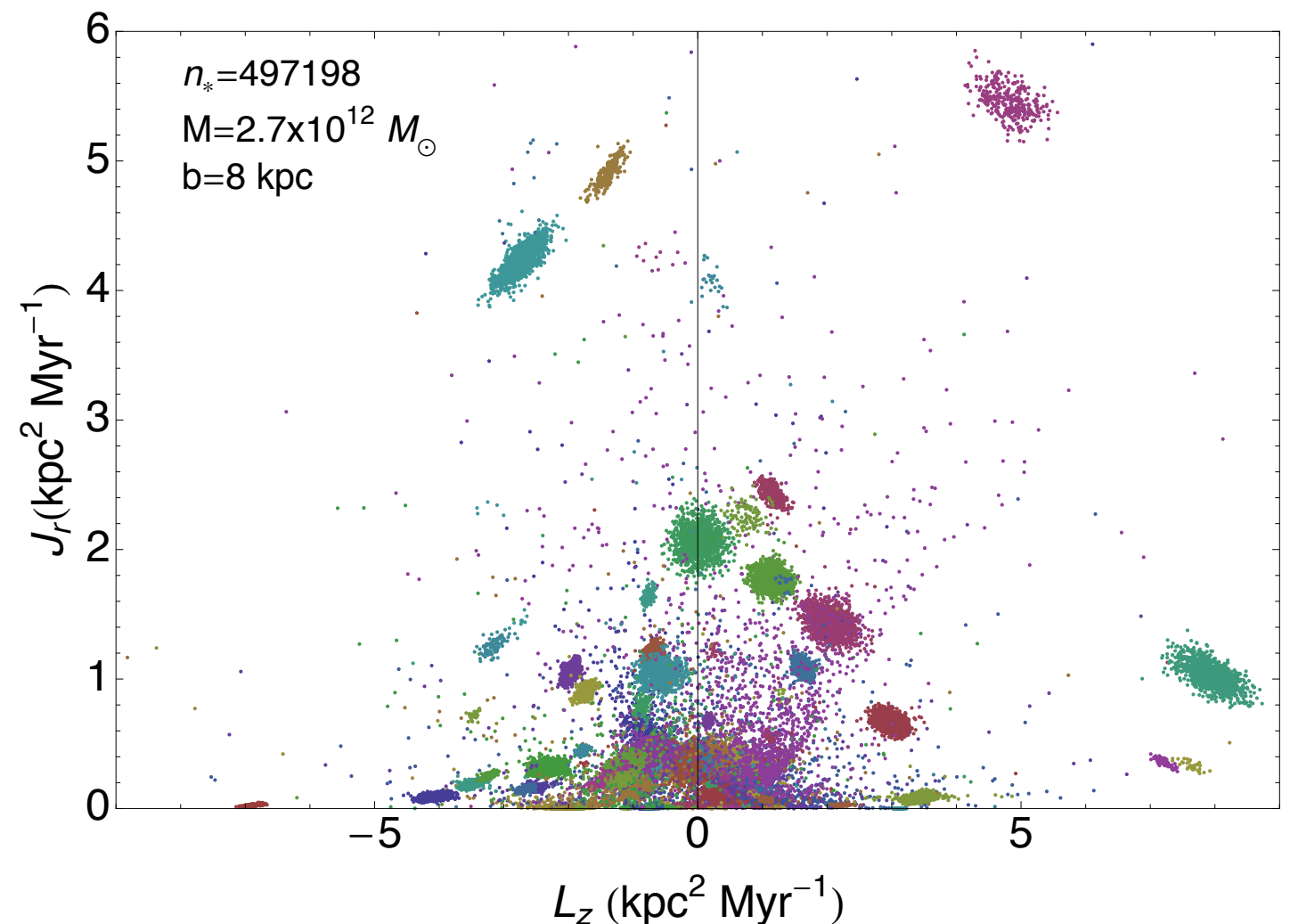
# The accreted stellar halo is clumpy in action space



← View in Galactic coordinates

Sanderson, Helmi, & Hogg 2015

View in action space  
(using correct potential)





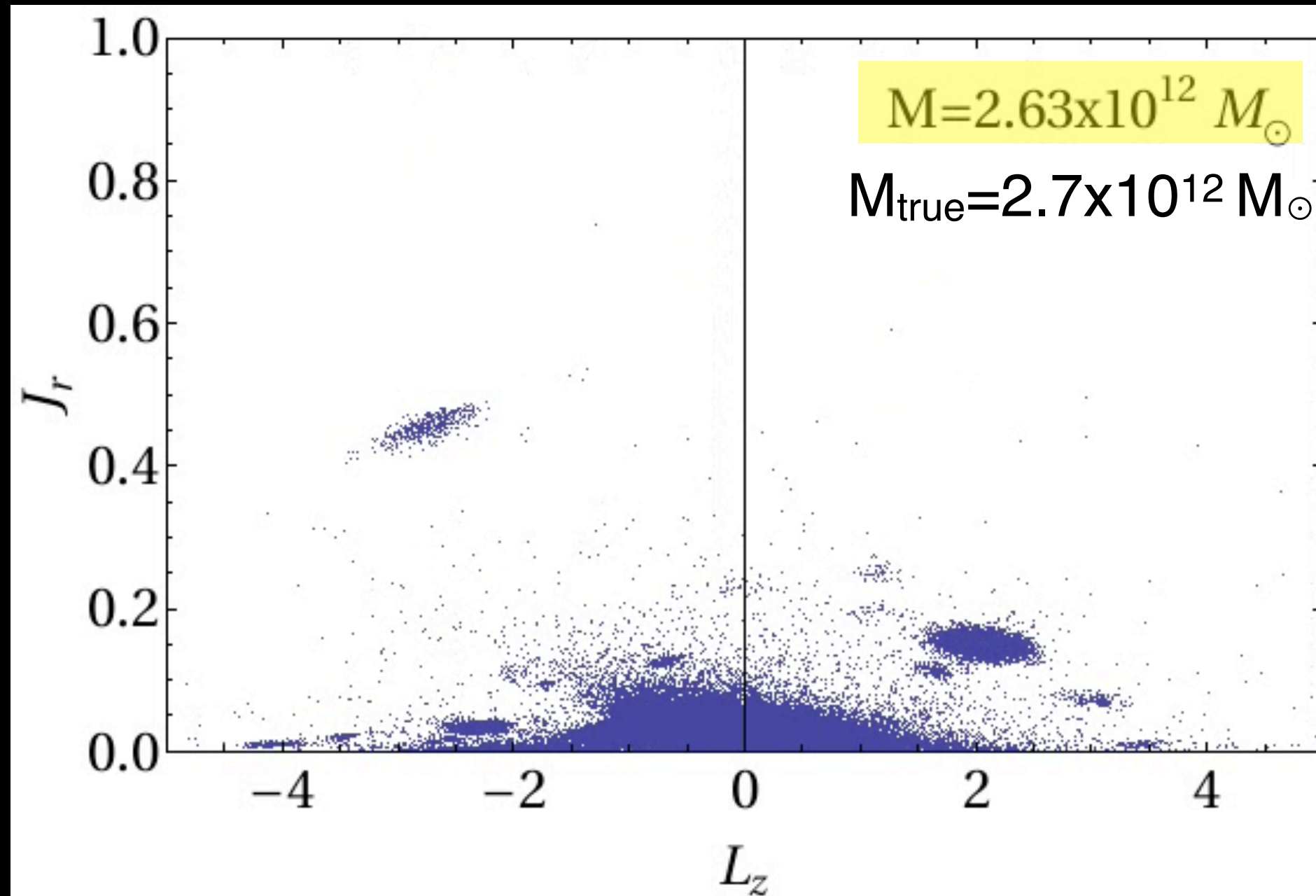
# Actions are most clustered in the correct potential

$$J_r = \frac{GM}{\sqrt{-2E}} - \frac{1}{2} \left( L + \sqrt{L^2 + 4GMb} \right)$$

Potential parameters

Observations

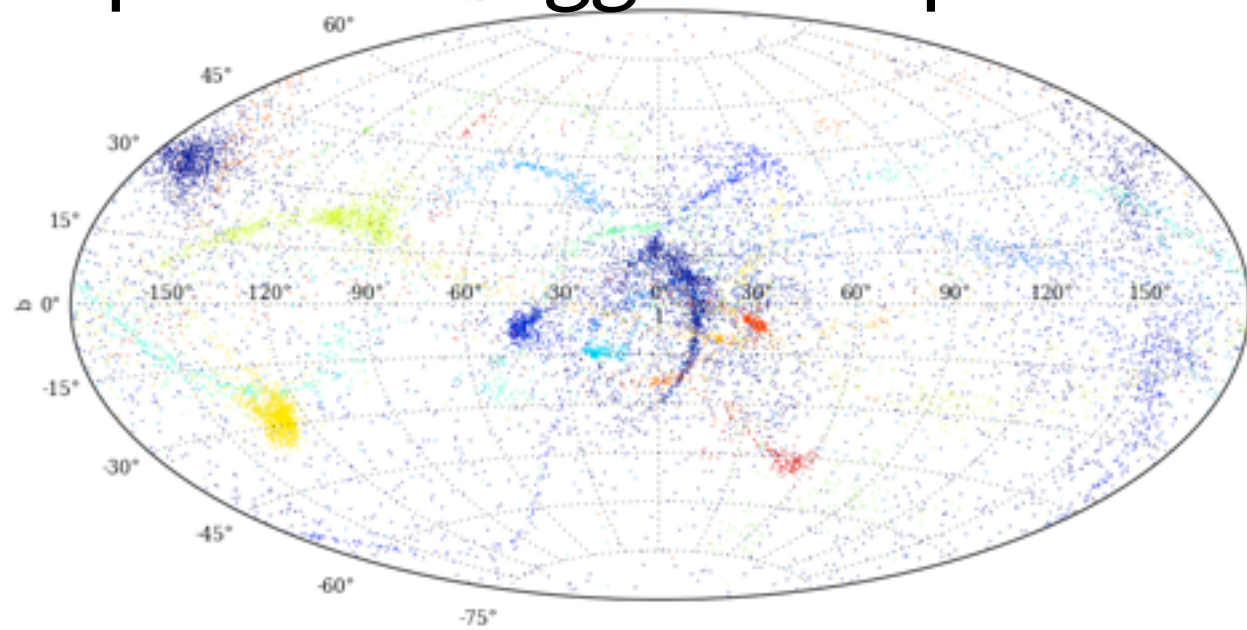
Both



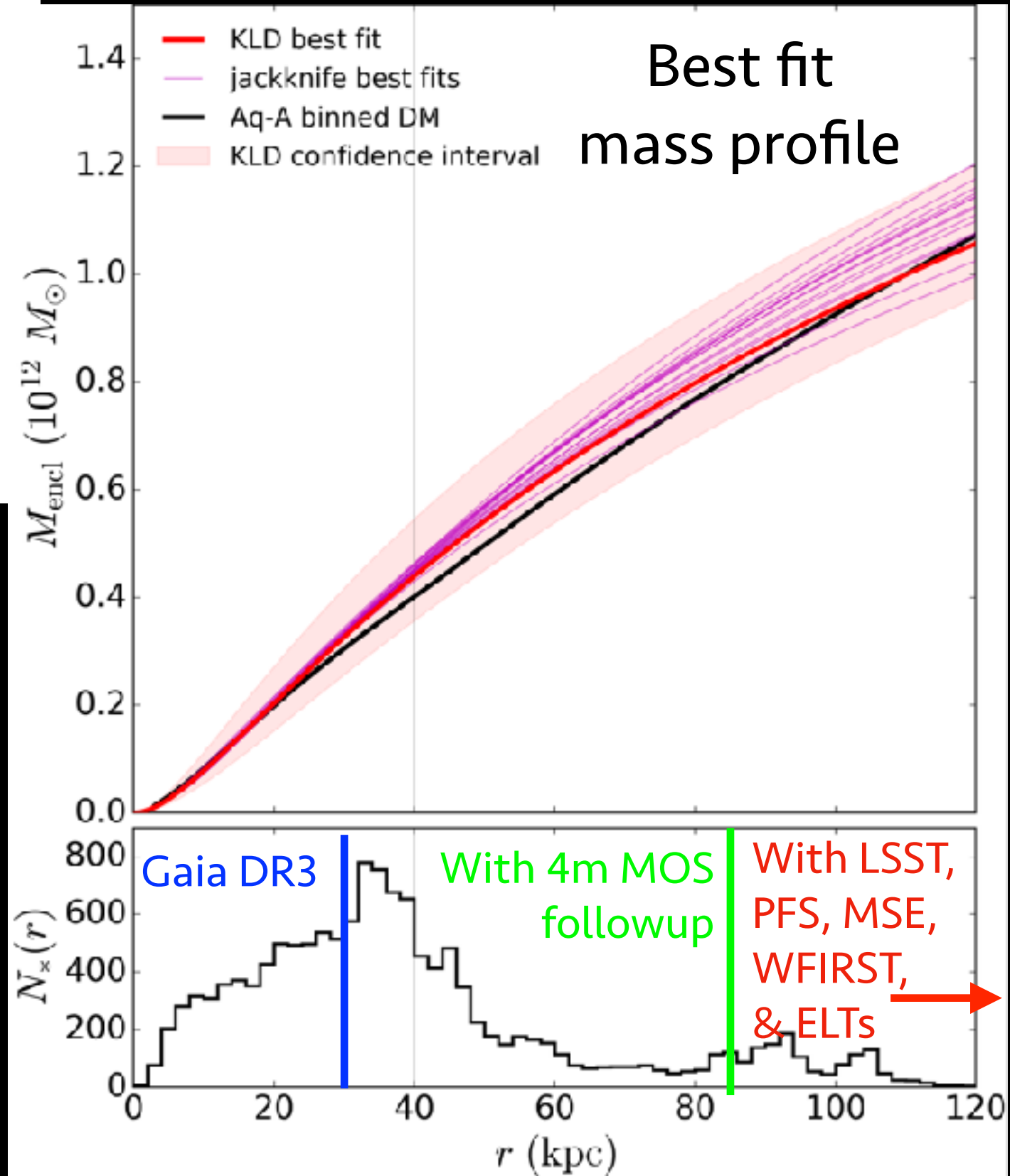
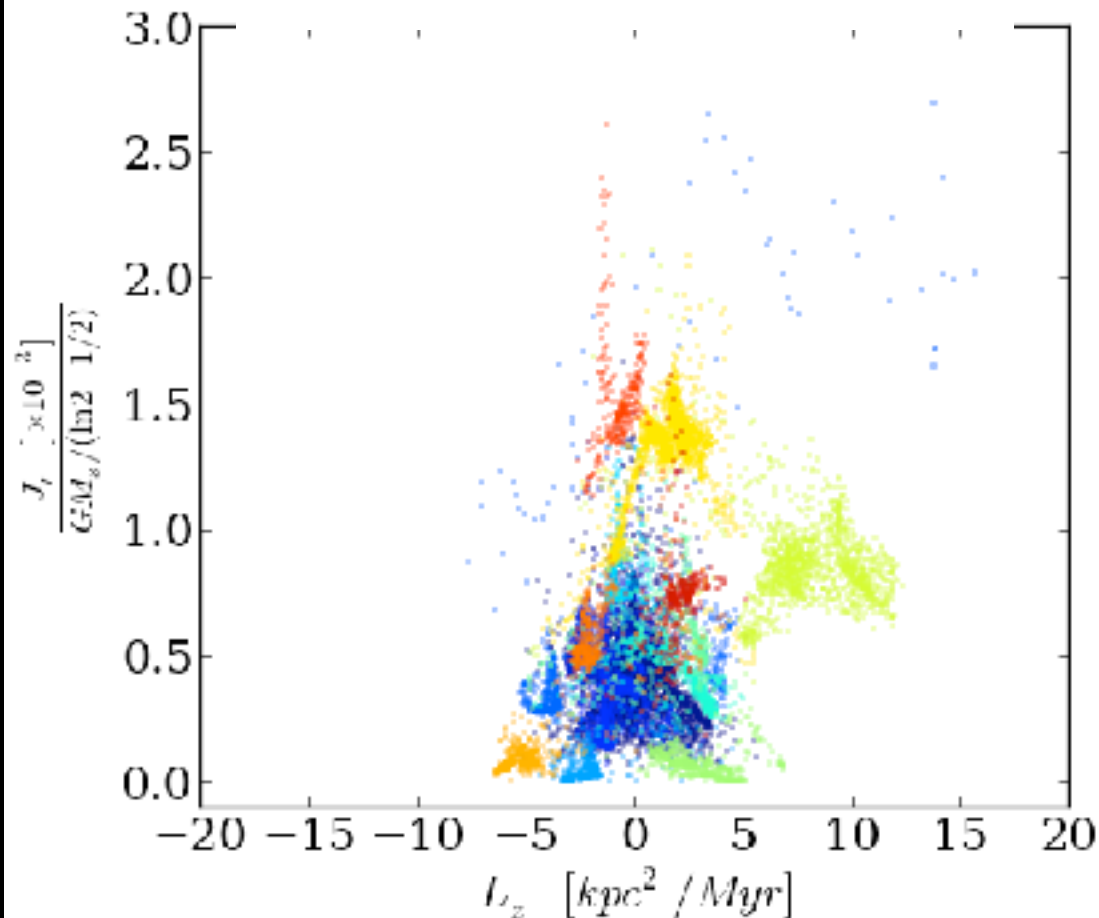
Sanderson, Helmi, & Hogg 2015

# The stellar halo constrains the MW's gravitational potential

## Aquarius A tagged star particles



## Best spherical NFW fit



Sanderson et al. 2017a

# techniques for modeling tidal streams

- Orbit integration (e.g. Koposov, Rix, & Hogg 2010)
  - Fastest but inaccurate (see e.g. Sanders & Binney 2015)
  - can be used to search for streams (e.g. Malhan & Ibata 2018)
- Fast stream approximation (see e.g. Küpper et al 2015)
  - Many methods available (see papers by Fardal, Bonaca, Sanders, Bovy, ...)
  - better approximation than orbit integration
  - More free parameters: need assumptions about progenitor, stripping rate
- N-body modeling (e.g. Law & Majewski for Sgr, Fardal et al. for M31 giant stream)
  - Most physically realistic, but computationally demanding (see <https://milkyway.cs.rpi.edu/>)
  - Above methods used to narrow down large parameter space
- Clustering methods (Peñarrubia+2012, Magorrian 2014, Sanderson+2015)
  - membership not required (but helpful); prior is that stars are accreted
  - fit many streams simultaneously, but can be derailed by one large contributor
  - need 6D data for stars in sample



**where are we now?**

# The MW's mass & shape are well constrained in the inner ~20 kpc...

Wegg, Gerhard, & Bieth 2019  
Posti & Helmi 2019

Dark Matter (CDM)

Stars

100 kpc

100 kpc

...which is probably less than a tenth  
the radius of the DM halo.

**where are we headed?**



# Gaia is only the beginning

2018	2019	2020	2021	2022	2023	2024	2025
------	------	------	------	------	------	------	------

**LSST**

**Gaia**

**Ext**

**Euclid**

**WFIRST**

**Subaru PFS**

**4MOST**

**DESI**

**WEAVE**

**SDSS-V**

**GMT**

**TMT**

**ELT**

**MSE (2027) →**

By 2028, we will have  
6+D information  
for stars to the MW's  
virial radius and  
beyond (~300 kpc)...

..and resolved  
stellar maps of the  
~100 nearest MW-  
like galaxies

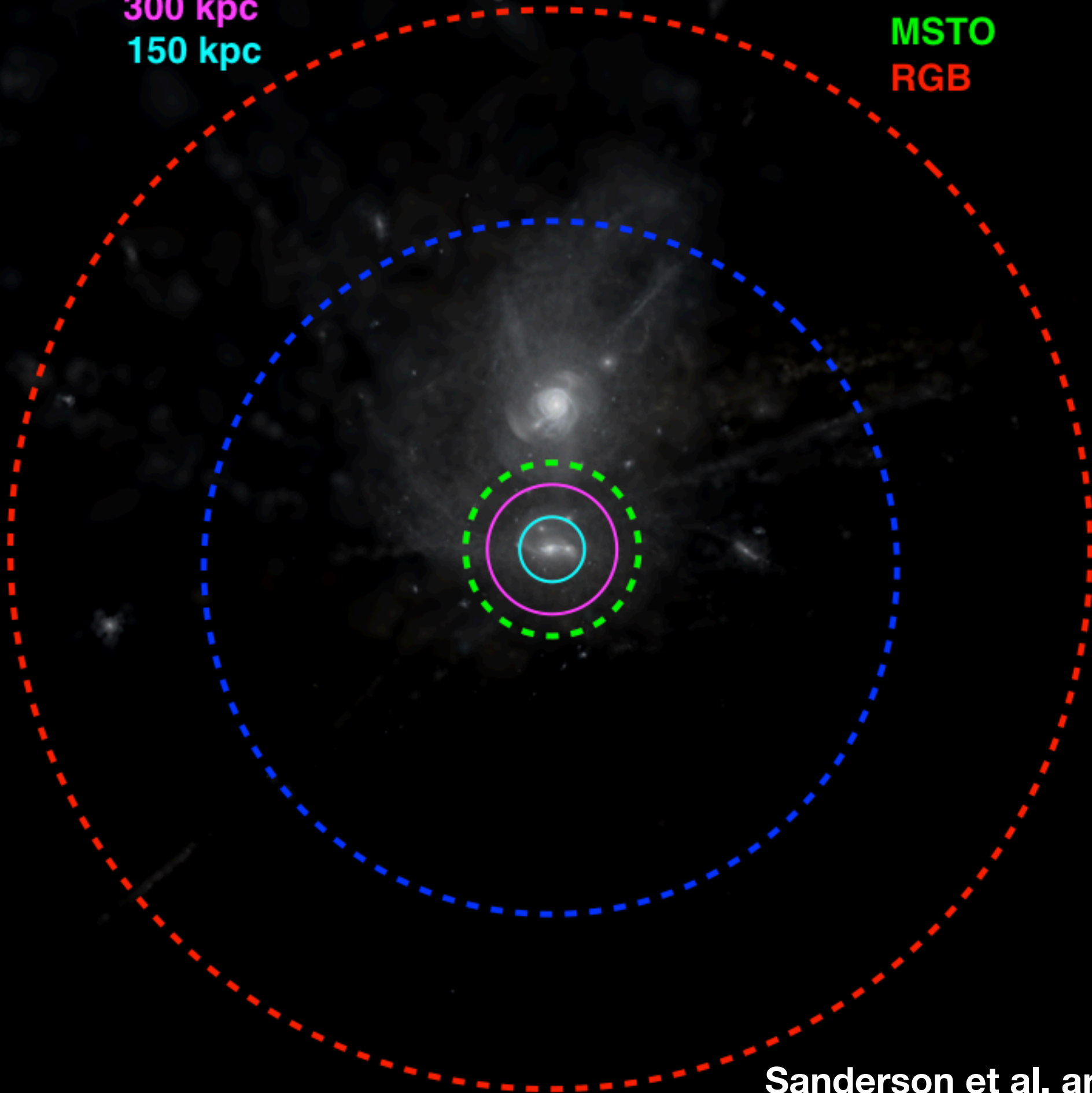
Astrometric + spectroscopic  
Photometric + astrometric

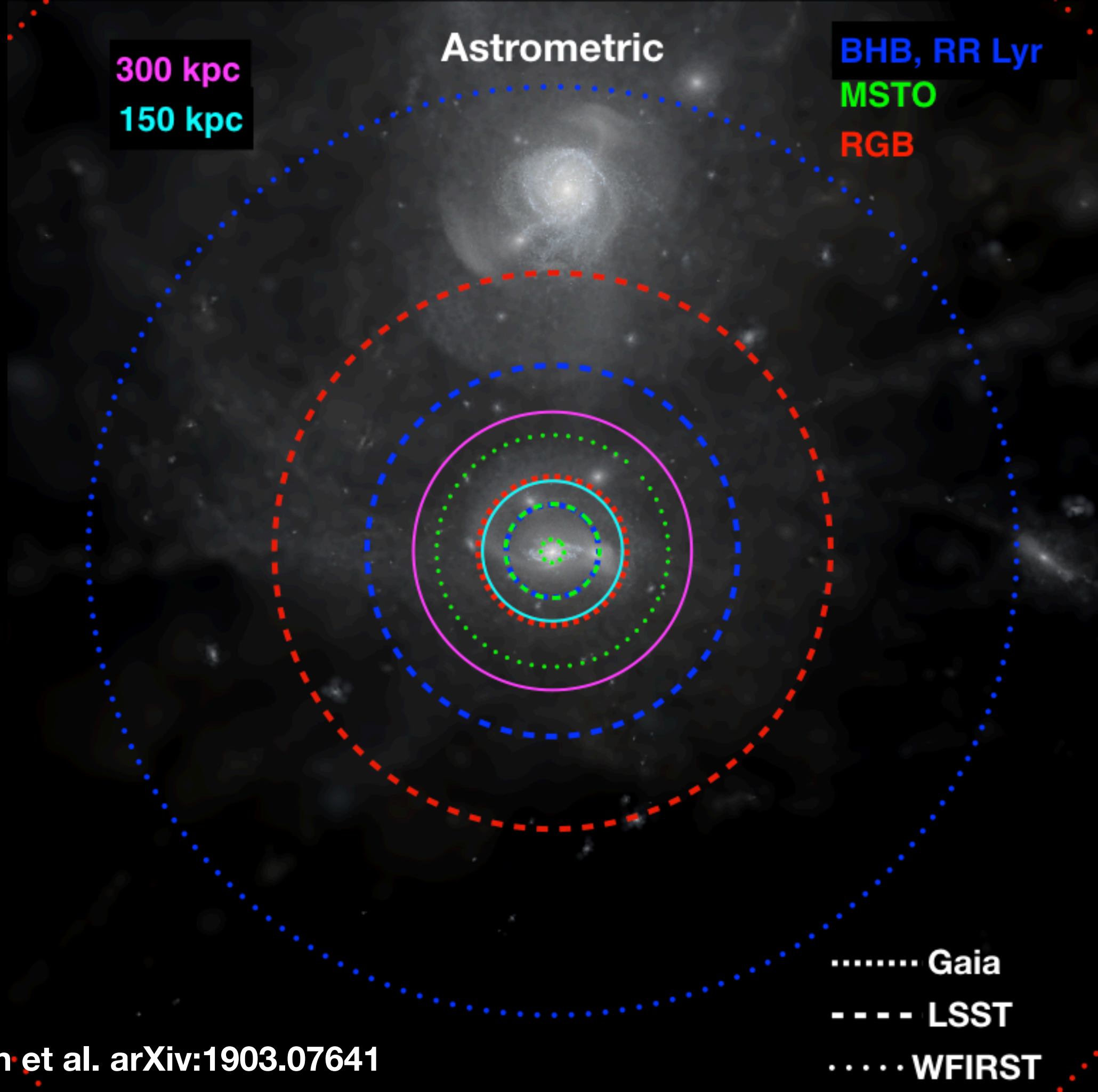
Spectroscopic: <4-m class  
Spectroscopic: >4-m class

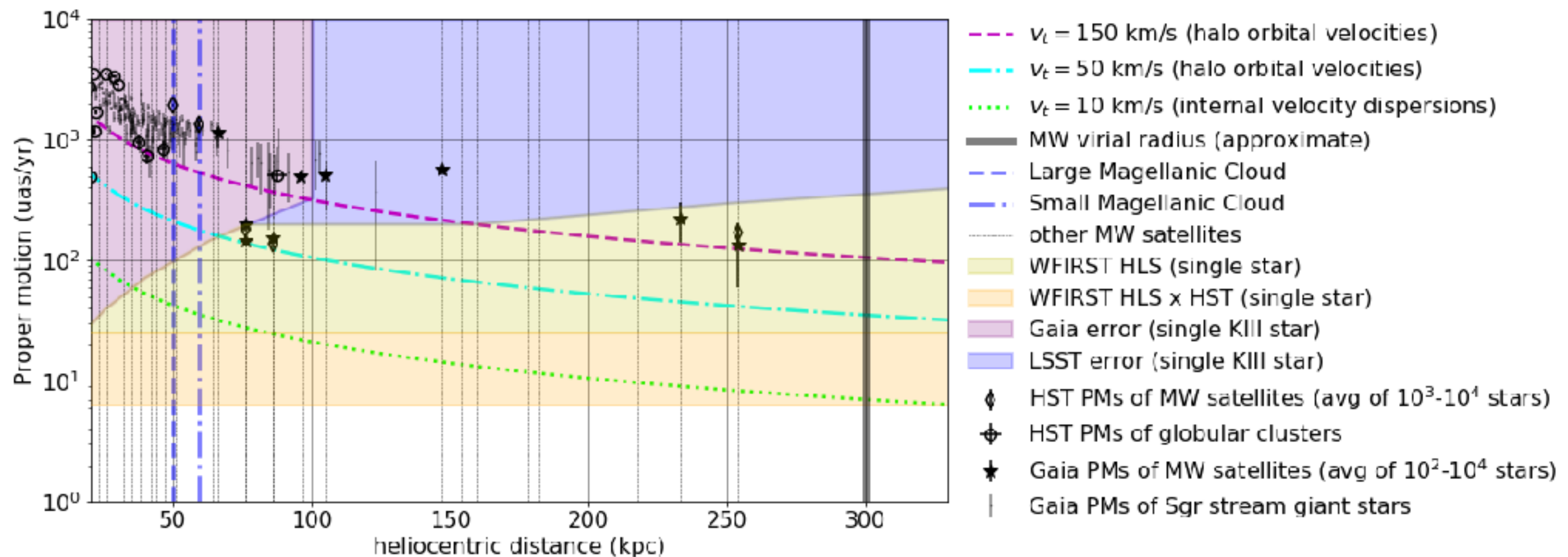
# Photometric (LSST)

300 kpc  
150 kpc

BHB  
MSTO  
RGB









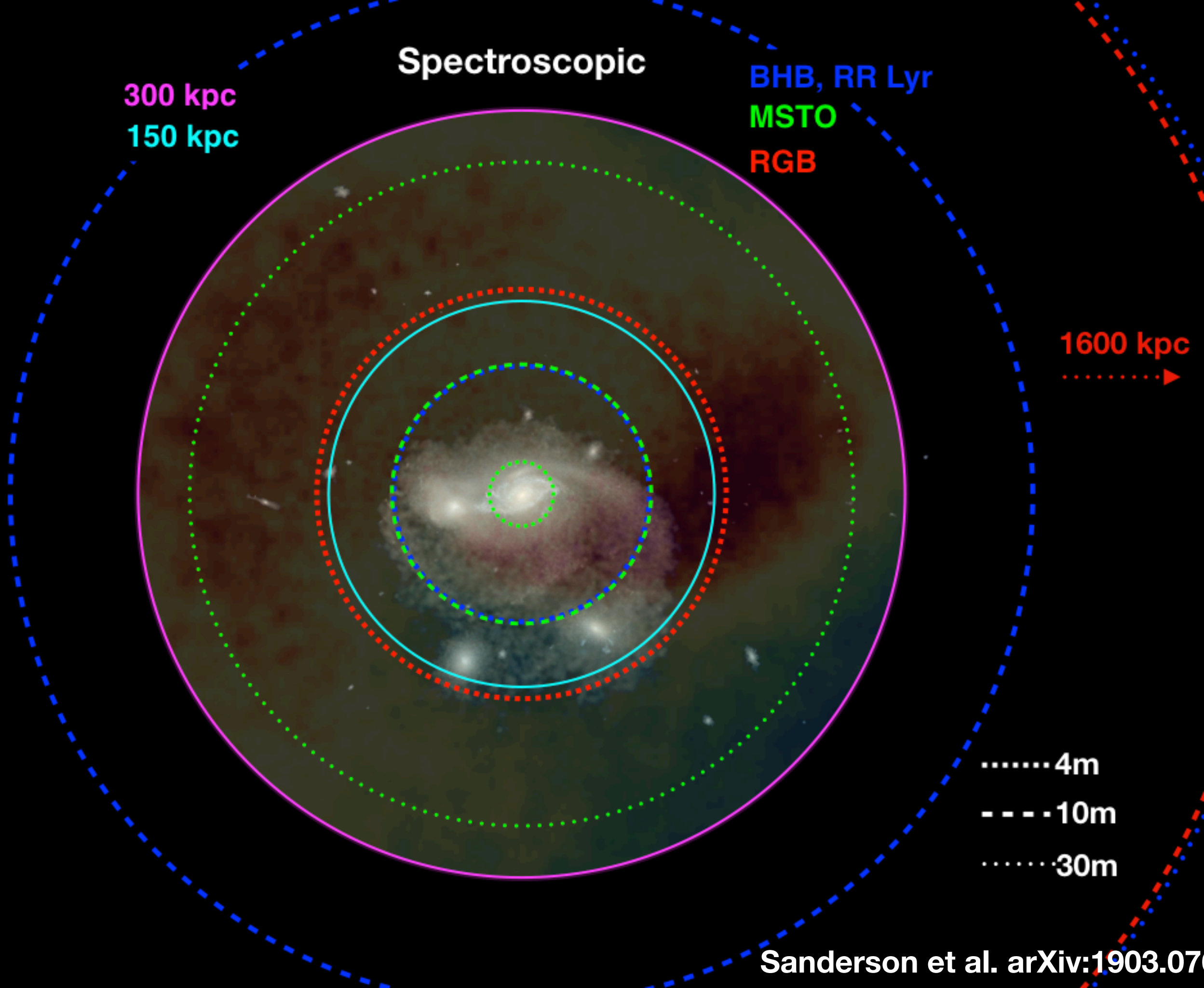
# Spectroscopic

300 kpc  
150 kpc

BHB, RR Lyr  
MSTO  
RGB

1600 kpc

..... 4m  
- - - 10m  
..... 30m



# To learn more about action-angle variables...

- Binney & Tremaine, Galactic Dynamics (2008 edition) chapter 3 has an introduction. Your institute may give access to the electronic version.
- Goldstein, Poole & Safko, Classical Mechanics (2002 edition) chapters 8-10 focus on the mathematical physics of the action transformation
- Wilma Trick's talk at the recent KITP conference on Gaia has an intuitive introduction to actions based on the epicyclic approximation
- Helmi & White, 1999 discusses how stellar streams evolve in action space
- McGill & Binney, 1990 and subsequent papers discuss how to compute actions and angles for generic gravitational potentials