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Distribution Functions Introduction

Steady-state modelling

metho

Satellite trace

Summary

cross-check

### Towards optimal dynamical models of the Milky Way halo mass --Why satellites are better dynamical tracers

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References

arxiv:1502.03477, 1507.00769, 1507.00771, 1605.09386, 1801.07373, 1909.02690, 1910.11257,..

Collaborators Wenting Wang (IPMU), Zhaozhou Li (SJTU) Shaun Cole (Durham), Carlos Frenk, et al.

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### Milky Way mass divergence



Different measurements disagree by  $\sim \times 4$ : Systematics! in the modelling of the tracers

(Wang,Han+19, in prep)

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Distribution Functions

#### Introduction

test

Steady-state modelling

metho

tests

Satellite tracers

Summary

cross-check

### Steady-state methods

• time independent tracer distribution function (DF)

$$P_{\psi}(\vec{x},\vec{v}) \Rightarrow \psi$$

• Jeans theorem:

$$\frac{\partial P}{\partial t} = 0 \Leftrightarrow P(\vec{x}, \vec{v}) = f(J_1, J_2, J_3...)$$

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- J<sub>1</sub>, J<sub>2</sub>, J<sub>3</sub>...: integrals of motion
- additional assumptions about functional form required

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Distribution Functions

#### Introduction

test

Steady-state

meth

tests

Satellite tracers

Summary

cross-check

# Testing a state-of-the-art f(E, L) method

$$\begin{cases} \mathcal{F}(E,L) = L^{-2\beta} \mathcal{F}(E) \\ \text{NFW potential } (M,c) \\ \int f(E,L) d^{3}v = \rho(r) \end{cases} \\ \approx \{ \frac{\mathcal{O}^{2+1}|\theta^{\alpha}(\frac{1}{2^{\alpha}}-w(1-\theta))-\frac{1}{2^{\alpha}+w(2^{\alpha}(L)-1)}+1} \int_{L}^{L} \frac{\mathcal{O}^{2}(w(1-\theta))-1}{2^{\alpha}+w(2^{\alpha}(L)-1)} \int_{L}^{L} \frac{\mathcal{O}^{2}(w(1-\theta))-1}{2^{\alpha}+w(2^{\alpha}(L)-1)}} \int_{L}^{L$$



## Fit $P_{\psi}(x, v)$ to Aquarius halos

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Distribution Functions

Introductio

test

Steady-state modelling

metho

tests

Satellite tracers

Summary

cross-check

# Testing a state-of-the-art f(E, L) method

$$\begin{cases} f(E,L) = L^{-2\beta}F(E) \\ \text{NFW potential } (M,c) \\ \int f(E,L)d^{3}v = \rho(r) \end{cases} \Rightarrow P(x, v | \psi(M,c))$$



The fits are biased!

• fail to describe the loosely-bound particles

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Distribution Functions

Introduction

tes

Steady-state modelling

method

tests

Satellite tracers

Summary

cross-check

## the orbital Probability Distribution Function (oPDF)

Steady-state solution to collisionless Boltzmann equation:

 $dP(x|\text{orbit}) \propto dt$ 



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$$dP(r|E,L) = \frac{dr}{v_r(E,L,r)T(E,L)}$$

$$(Han+16a)$$

$$(Han+16a)$$

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#### Distribution Functions

Introduction

test

Steady-state modelling

method

tests

Satellite tracers

Summary

cross-check

## oPDF: Fits to Aquarius haloes

Tests on haloes from cosmological simulations:



- no global systematic bias using oPDF: main source of bias removed
- still significant and *correlated* individual biases?



#### Functions Introduction test

Steady-state modelling

#### tests

Satellite tracer

- Summary
- cross-check

### oPDF: Fits to many haloes



- Ensemble-unbiased
- Significant irreducible individual bias
  - $\sigma_M \sim 0.1 \text{ dex} (20\%)$  for DM
  - correlate similarly as the statistical noises



### oPDF: Fits to many haloes



- Ensemble-unbiased
- Significant irreducible individual bias
  - $\sigma_M \sim 0.1 \text{ dex} (20\%)$  for DM
  - correlate similarly as the statistical noises
  - Interpretation: correlated phase-space structure reduces  $N_{\rm eff}$





### (Wang, Han+17)

- Stars are less in equilibrium than DM
  - DM:  $\sigma_M \sim 0.1 \text{ dex } (20\%)$
  - Star:  $\sigma_M \sim 0.3 \text{ dex } (\sim \times 2)$
- Ubiquitous: Almost identical results from Jeans modelling (Wang, Han+18)

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### Fits to Satellite Galaxies





### Fits to Satellite Galaxies



- Satellites are better tracers than stars
- Dynamical state of satellite tracers are close to DM

### Han+2019



Satellite tracers

#### Fits to Satellite Galaxies 1.00 1.00 sat fits sat fits 0.75 0.75- $\sigma_{cat}$ $\sigma_{\rm sat}$ $\sigma_{\rm DM \rightarrow sat}$ $\sigma_{\rm DM}$ 0.50 0.50- $\sigma_{\rm star}$ 0.25-0.25 log(c/c<sub>true</sub>) log(c/c<sub>true</sub>) 0.00 0.00--0.25 -0.25-0.50--0.50 -0.75--0.75 -1.00 -1.00--0.5 0.0 0.5 1.0 -1.0 -Ó.5 0.0 0.5 1.0

Satellites are better tracers than stars

 $log(M/M_{true})$ 

• Dynamical state of satellite tracers are close to DM

### Han+2019

 $log(M/M_{true})$ 



Distribution Functions

Introduction

test

Steady-state modelling

metho

tests

#### Satellite tracers

Summary

cross-check

# Satellites as unbiased dynamical tracers



(Han+,2016c)

- Satellites follow the spatial distribution of DM
- Satellites follow the orbital distribution of DM

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Distribution Functions

Introduction

test

Steady-state modelling

metho

tests

#### Satellite tracers

Summary

cross-check

## Satellites as unbiased dynamical tracers



- Satellites follow the spatial distribution of DM
- Satellites follow the orbital distribution of DM

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Distribution Functions

Introduction

test

Steady-state modelling

metho

tests

#### Satellite tracers

Summary

steady-state:  $P_{\psi}(r|E, L)$ 





Going beyond the steady-state



information



Li, Qian, Han+2019

### See Zhaozhou Li's talk!

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Distribution Functions

Introduct

test

Steady-state modelling

method

tests

Satellite tracers

Summary

cross-check

## Summary and Conclusions

- Dynamical models have to be carefully designed for the system
  - easily biased by unjustified assumptions
  - pure steady-state methods can avoid these unncessary biases
- Simulated haloes are approximately steady-state systems
  - correlated phase-space structure violates steady-state assumption, leading to irreducible stochastic bias
    - Dynamical information exhausted with  $\sim$  1000 DM particles or  $\sim$  50 stars
    - Intrinsic  $\sigma_M \sim 20\%$  (DM) or  $\sim \times 2$  (stars): the information limit of steady-state modelling
- Satellite galaxies are better tracers than stars, with a dynamical state close to DM particles:  $\sigma_M \sim 25\%$  with around 1000 satellites.
  - Going beyond the steady-state information can further improve dynamical inference

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Distribution Functions

test

Steady-state modelling

metho

tests

bucchie en

Summary

## What determines the systematics?



• The phase distribution is only approximately uniform (steady-state).

$$\theta(r, \operatorname{orbit}) = \frac{t}{T}, \quad dP(\theta|\operatorname{orbit}) = d\theta$$

• There are correlated structures associated with substructures and streams.

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- Distribution Functions
- Introduct
- test
- Steady-state modelling
- metho
- tests
- Satemite trac
- Summary
- cross-check

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Distribution Functions

Introductio

test

Steady-state modelling

metho

tests

Satellite tracers

#### Summary

cross-check

### What determines the systematics?





 $\Delta \ln L \sim rac{N}{N_{
m eff}} \chi^2(2)$ 

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Distribution Functions

Introduction

test

Steady-state modelling

metho

tests

Satellite tracers

Summary

cross-check

### What determines the systematics?





$$N_{\text{stream,eff}} = \frac{(\sum n_i)^2}{\sum n_i^2} \in [1, m]$$

$$\Delta \ln L \sim \frac{N}{N_{\rm eff}} \chi^2(2)$$

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Distribution Functions Introduction

test

Steady-state modelling

metho

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Summary

cross-check

# Jeans equation

Independent test: The spherical



Taking the velocity moment  $(\int d^3 v \mathbf{v}[])$  of the collisionless Boltzmann equation

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

leads to the (spherical) Jeans equation:

$$\frac{\mathrm{d}(\rho\sigma_r^2)}{\mathrm{d}r} + 2\frac{\beta}{r}\rho\sigma_r^2 = -\rho\frac{\mathrm{d}\Phi}{\mathrm{d}r}$$

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Steady-state modelling method tests

Satellite tracers

Summary

cross-check

# Alternative test using Jeans equation

Same systematic biases due to deviation from steady-state

Additional bias if  $\beta(r)$  is unknown and assumed



### (Wang, Han+18)

### The amount of steady-state information is limited.