

# Non-Parametric Mass Modelling of Dwarf Galaxies

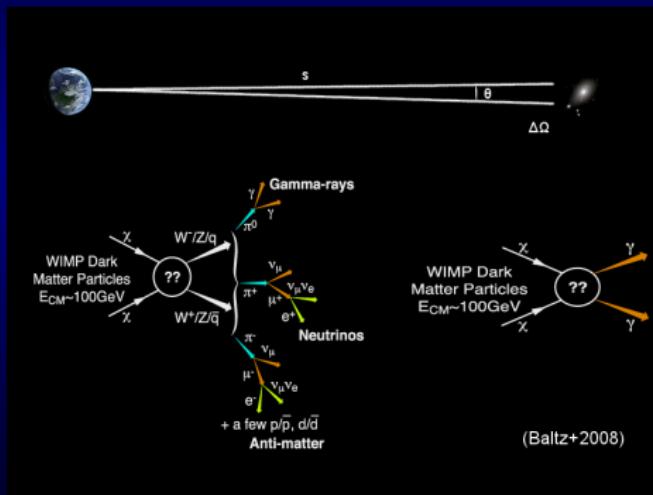
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# Direct DM detection

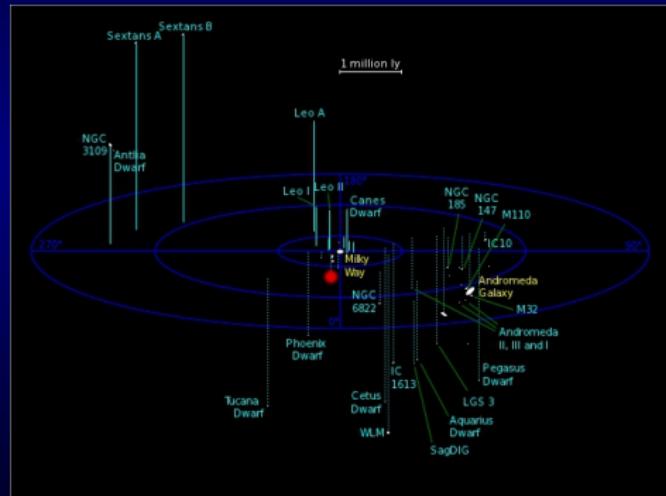


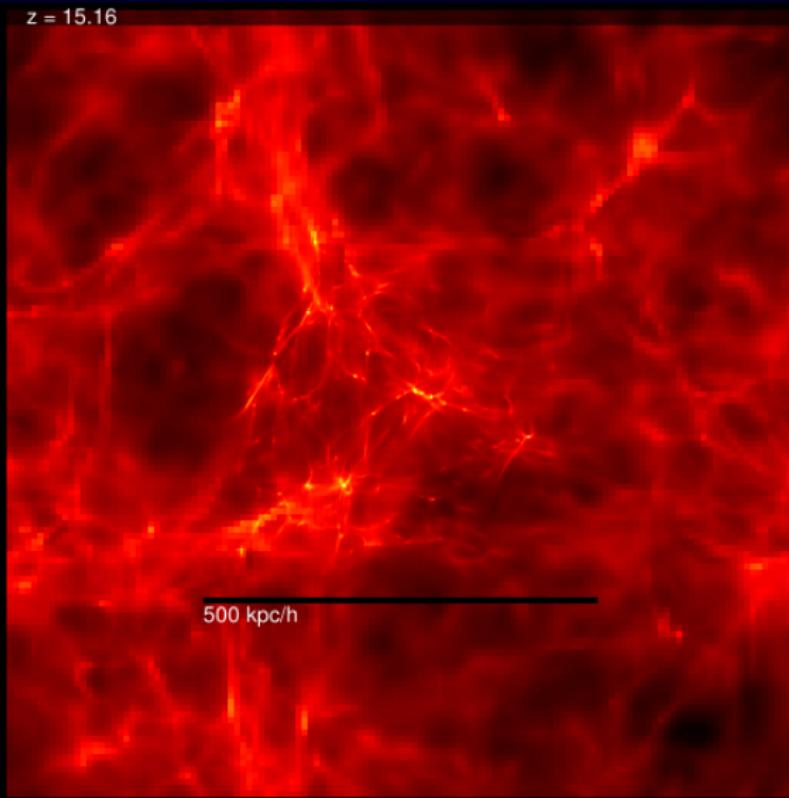
# Reaction Rate

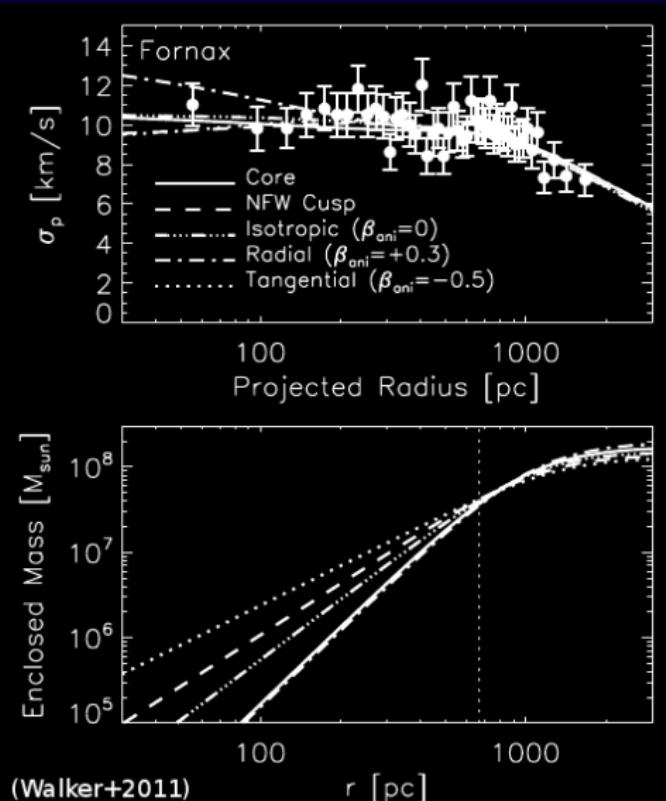
$$\frac{d\Phi(\Delta\Omega, E_\gamma)}{dE_\gamma} = \frac{1}{8\pi} \frac{\langle\sigma v\rangle}{m_{DM}^2} \frac{dN_\gamma}{dE_\gamma} \times J(\Delta\Omega) \Delta\Omega$$
$$J(\Delta\Omega) = \frac{1}{\Delta\Omega} \int_{\Delta\Omega} d\Omega \int_{\text{LOS}} ds \rho^2(r(s))$$

(Bertone+2005)

# Dwarf Galaxies







$$\rho_{\text{NFW}} = \frac{\rho_0}{(r/r_s)(1+r/r_s)^2},$$

$$\rho_{\text{ISO}} = \frac{\rho_0}{1+(r/r_c)^2}.$$

# Overview Mass modelling

- Jeans modelling: 1) derive equations between  $\nu$ ,  $\rho$ ,  $\sigma$ ,  $\Phi$  from collisionless Boltzmann equation 2) solve for  $\Phi$ , and ultimately  $\rho_{\text{DM}}$  3) restriction:  $\nu$ ,  $\sigma$  from observations
- Schwarzschild modelling: 1) postulate  $\Phi$  2) compute  $N$  orbits over  $M$  oscillations 3) reproduce  $\rho$  with population of these orbits
- DF models: Assume functional form of DF.
- Made 2 Measure: find  $N$ -body model via merit function

# Jeans equations

$$0 = \frac{df}{dt} = \frac{\partial f}{\partial t} + \nabla_{\vec{x}}f \cdot \vec{v} - \nabla_{\vec{v}}f \cdot \nabla_{\vec{x}}\Phi$$

$$0 = \frac{\partial f}{\partial t} + \dot{r}\frac{\partial f}{\partial r} + \dot{\theta}\frac{\partial f}{\partial \theta} + \dot{\phi}\frac{\partial f}{\partial \phi} + \dot{v}_r\frac{\partial f}{\partial v_r} + \dot{v}_{\theta}\frac{\partial f}{\partial v_{\theta}} + \dot{v}_{\phi}\frac{\partial f}{\partial v_{\phi}}$$

(Binney, Tremaine 2008)  
 moments:

$$\frac{1}{\nu} \frac{\partial}{\partial r} (\nu \sigma_r^2) + 2 \frac{\sigma_r^2 - \sigma_t^2}{r} = - \frac{\partial \Phi}{\partial r} = \frac{GM(< r)}{r^2}$$

+ higher order moments of velocity,  $\kappa_{\text{LOS}}$

# Motivation and aims for non-parametric method

- not bound to  $\rho(r) = \rho_{\alpha,\beta,\gamma,\dots}(r)$ , let data tell the form
- applicable to any gravitational model
- robust to noise in the data

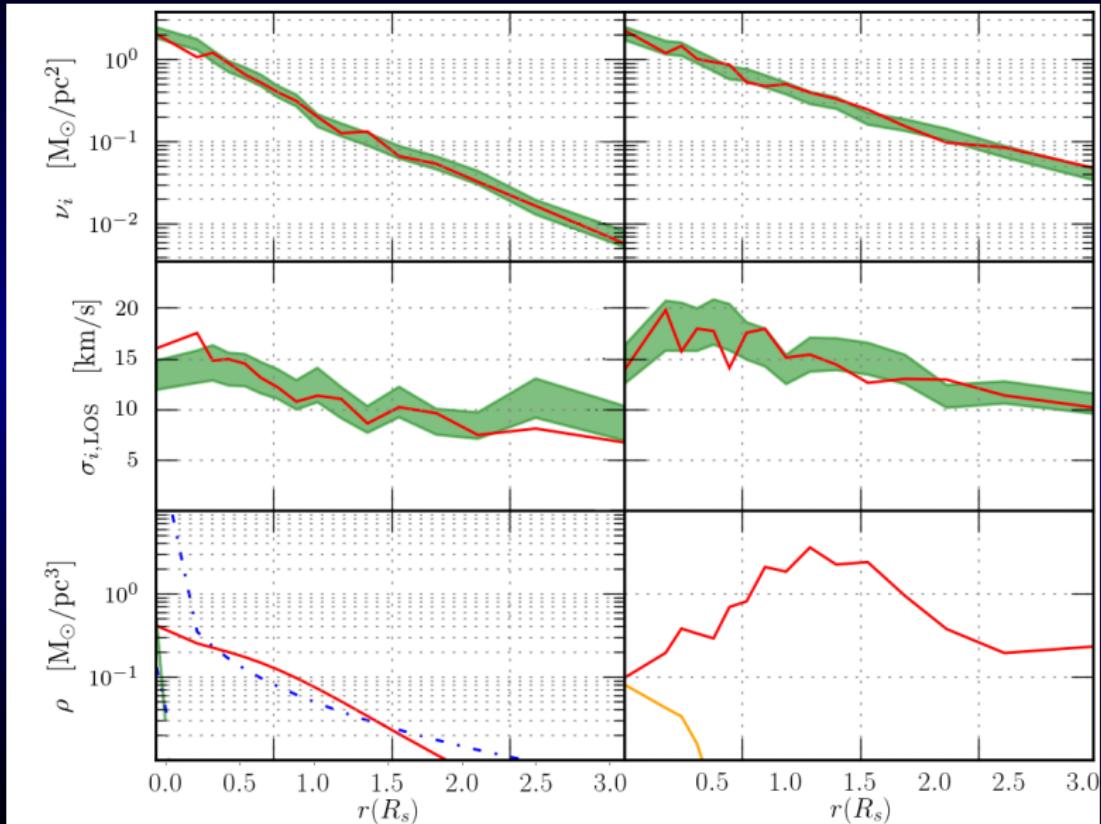
# What do we mean with “non-parametric”?

- model for  $\rho, \nu_i, \beta_i \equiv 1 - \sigma_t^2 / 2\sigma_r^2$  in  $N$  bins,
- MCMC with comparison to observed 2D properties
- error function:

$$\chi^2 = \sum_i \chi_{\nu,i}^2 + \chi_{\sigma_{\text{LOS},i}}^2 + \chi_{\kappa_{\text{LOS},i}}^2$$

- fit many more model parameters (bins) than constraints,  
 $5 \cdot N \gg n_{\text{constraints}}$
- marginalise over all bins with MCMC
- → find models that give good fits

# Example Step



# Algorithm Details

Priors:

- no rising density;
- total mass  $\geq$  baryonic mass;
- no  $\beta > 1$ , “smooth”  $\beta$ ;
- no constraints on  $\kappa$

Stepsizes:

- init: set to 5% of observed values;
- adapted set-wise during burn-in phase;
- $\rho$  parameterized as Lagrange polynomial.

# $M-\beta$ degeneracy

- (Merritt 1987): radial orbits: high mass; tangential orbits: low mass
- (Richardson+ 2013): higher moments  $\rightarrow$  more anisotropy parameters
- (Battaglia+ 2008): two populations with different  $r_{1/2}$  break degeneracy

# Moments of the Jeans equations

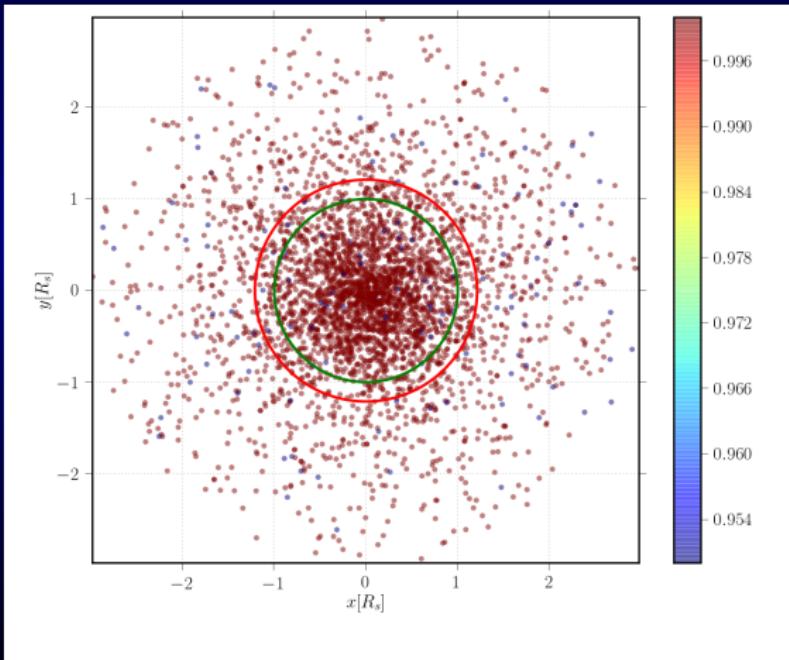
$$\begin{aligned}\sigma_r^2(R) &= \frac{1}{\nu(R)} \exp \left( 2 \int_{r_{\min}}^R \frac{\beta(s)}{s} ds \right) . \\ &\quad \int_R^\infty \frac{GM(< r)\nu(r)}{r^2} \exp \left( -2 \int_{r_{\min}}^r \frac{\beta(s)}{s} ds \right) dr \\ \sigma_{\text{LOS}}^2(R) &= \frac{2}{\Sigma(R)} \int_R^\infty \left( 1 - \beta \frac{R^2}{r^2} \right) \frac{\nu(r)\sigma_r^2(r)r}{\sqrt{r^2 - R^2}} dr\end{aligned}$$

(Lokas 2005)  
+ higher order moments

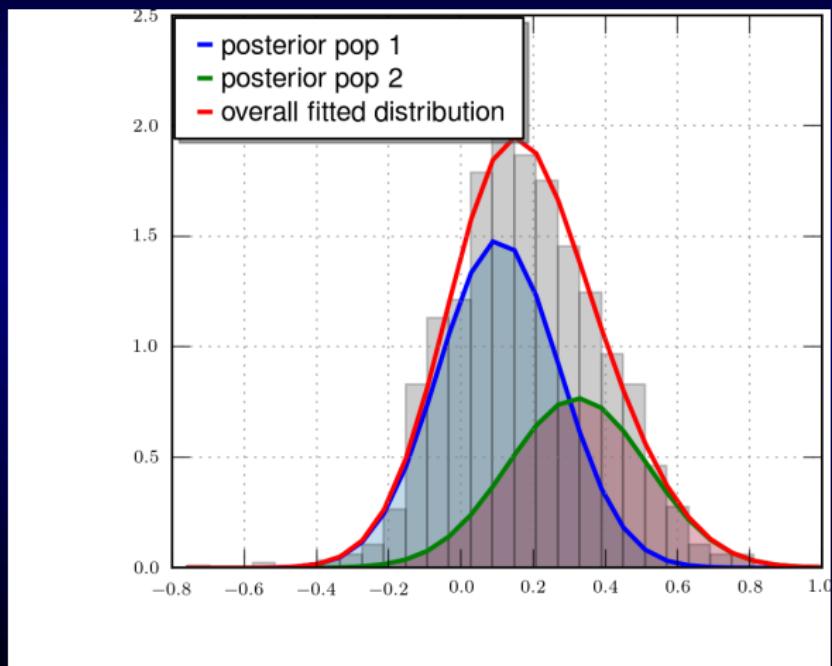
# Spherical Mock Data for Gaia Challenge

- cusped / cored profile,  $r_{DM} = 1000\text{pc}$
- 2 stellar tracer populations, with inner slope  $\gamma_* = 1.0$
- distinguished by metallicity  $W_{Mg}$
- different stellar scale lengths  $r_* = 500, 1000\text{pc}$
- total 9000 tracers
- includes systemic shift, binary motions
- further info: (Walker 2013)

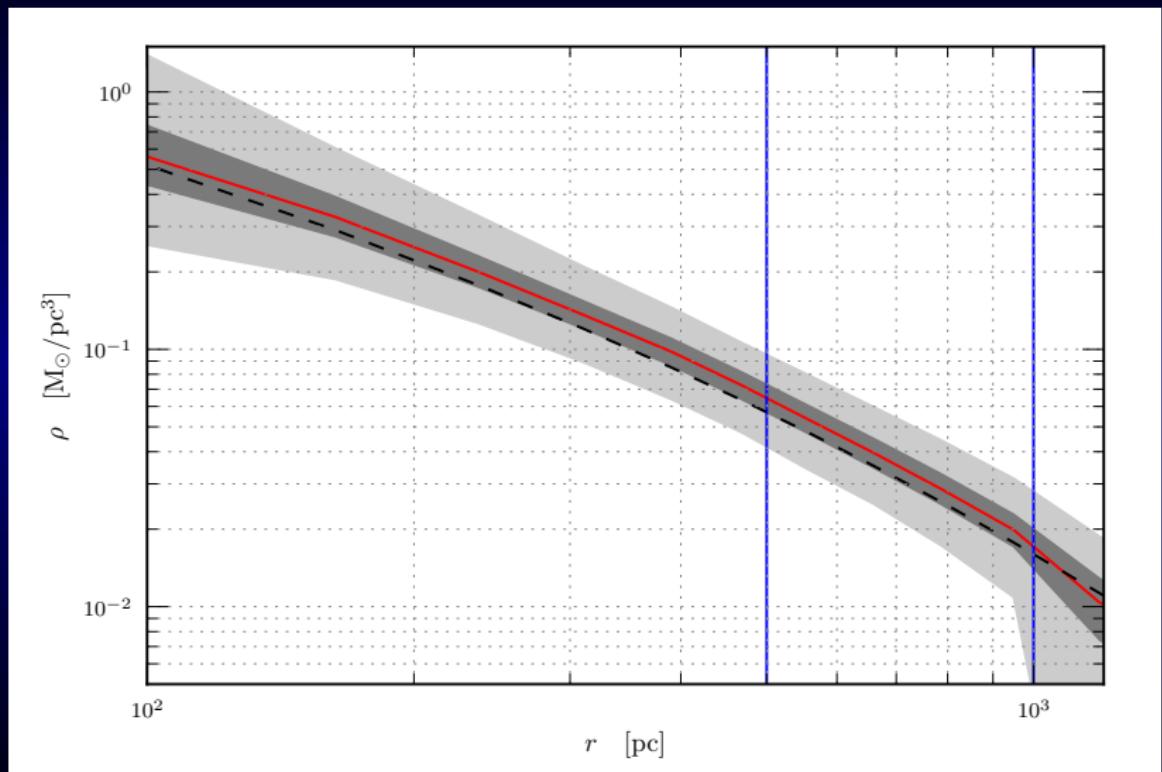
# Scales, Probability of Membership



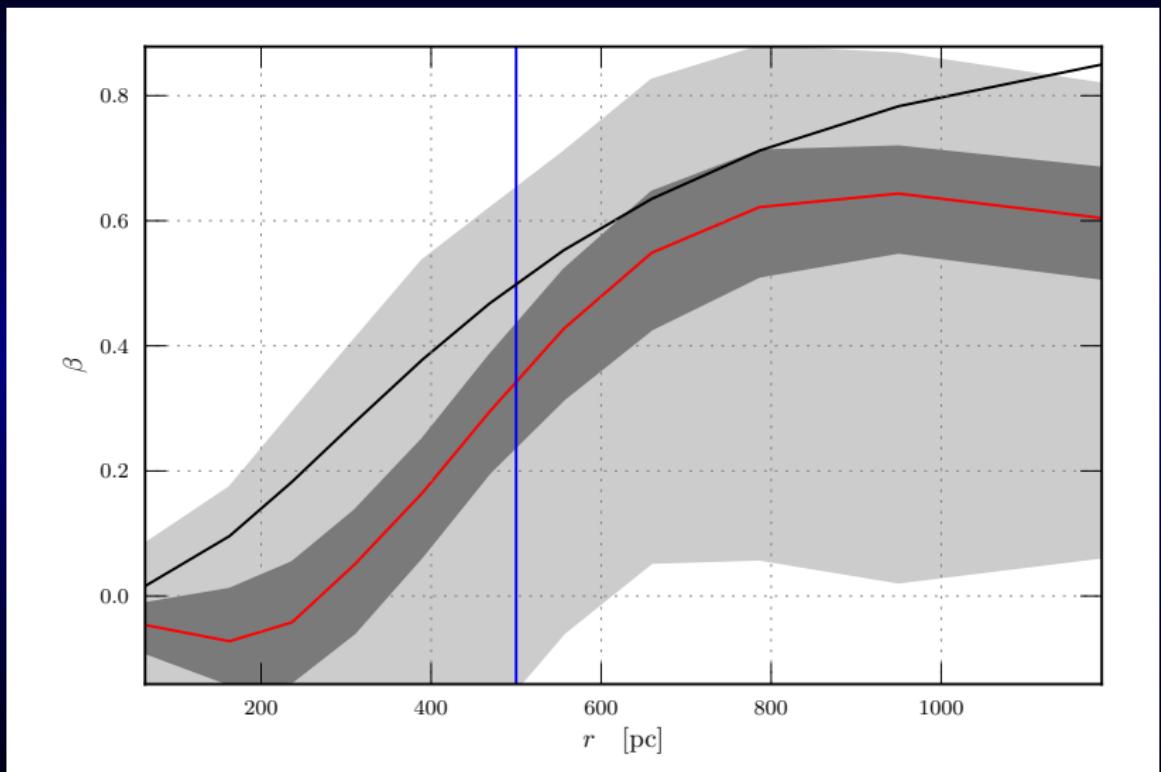
# Splitting by Metallicity



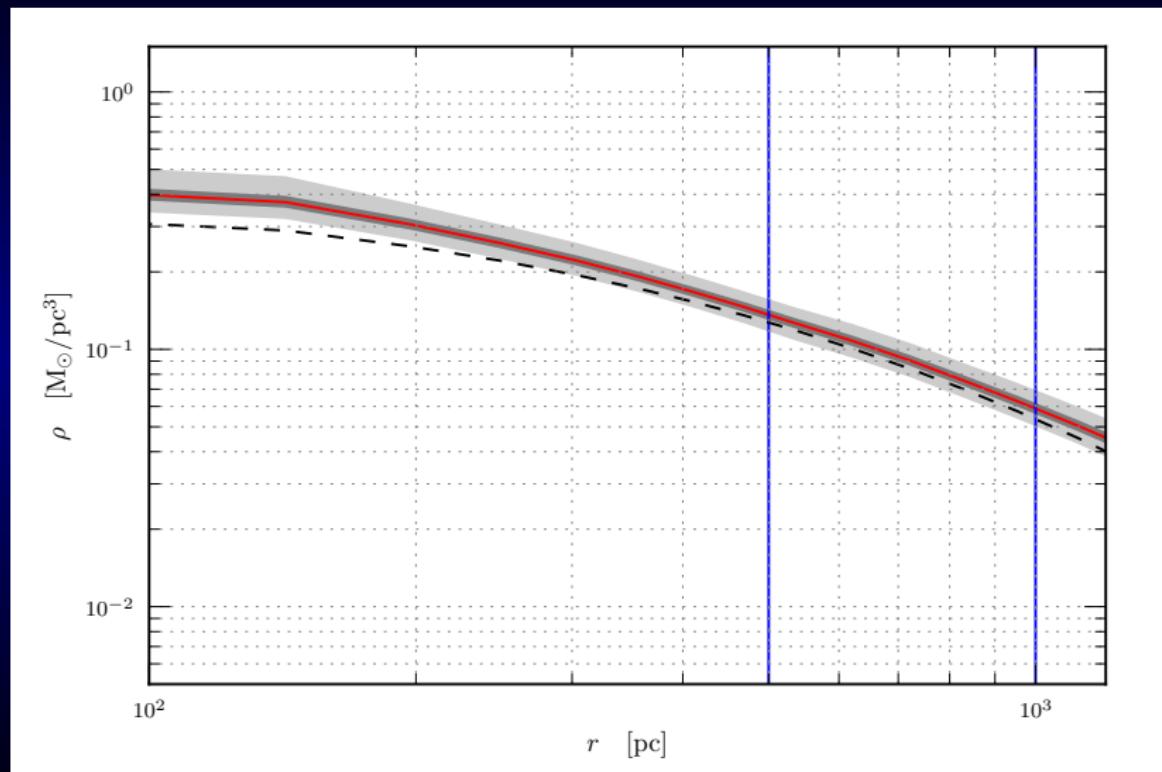
# Preliminary Result: Density Profile 2 Populations



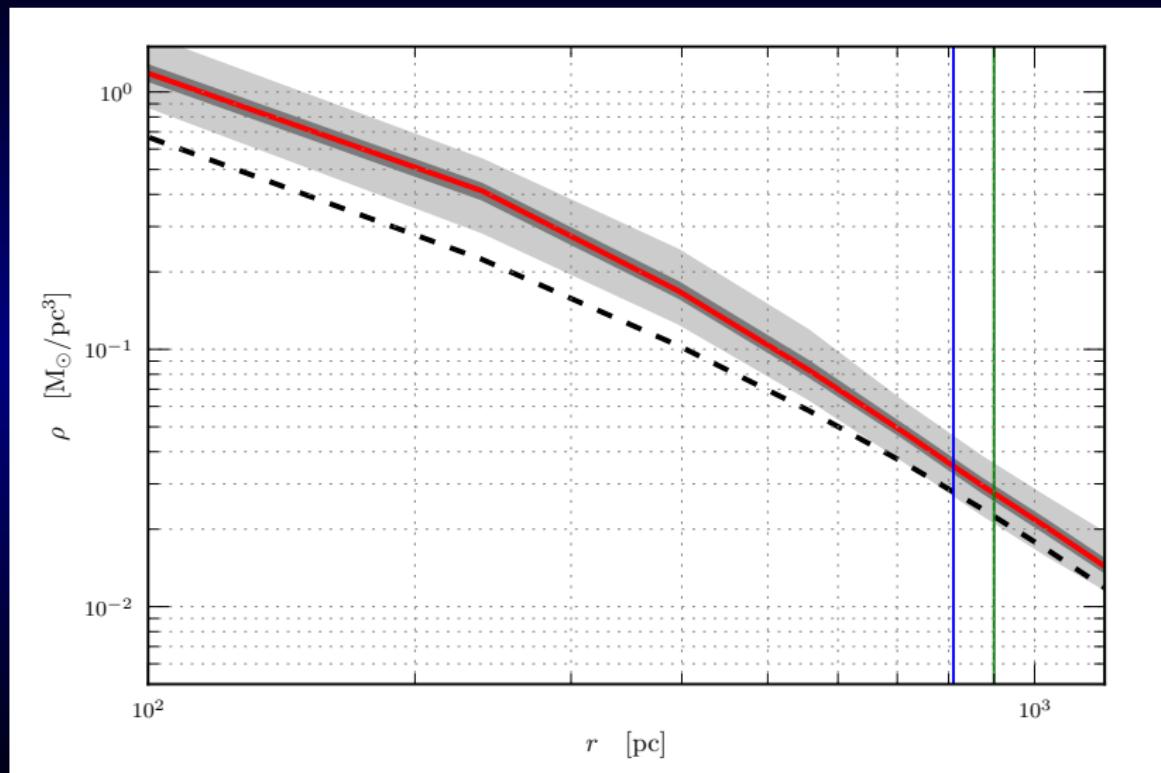
# Preliminary Result: Beta Profile



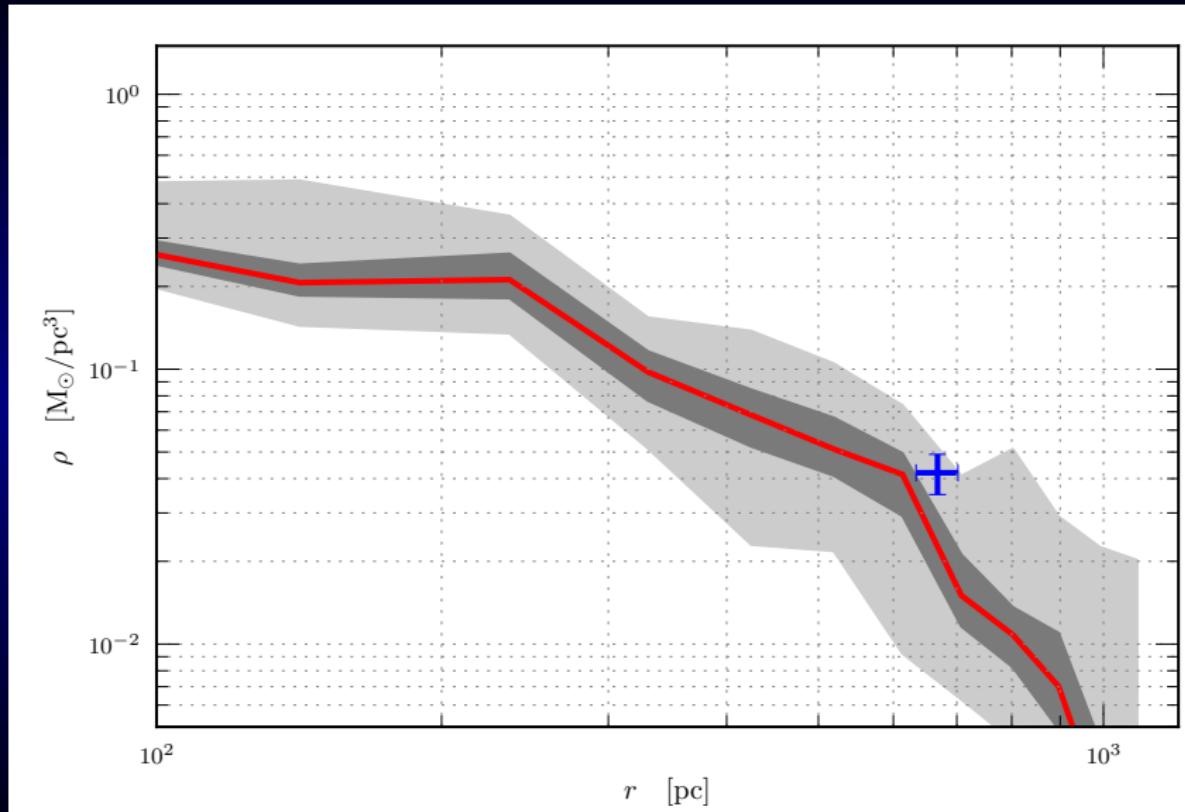
# Preliminary Result: Density Profile Cored



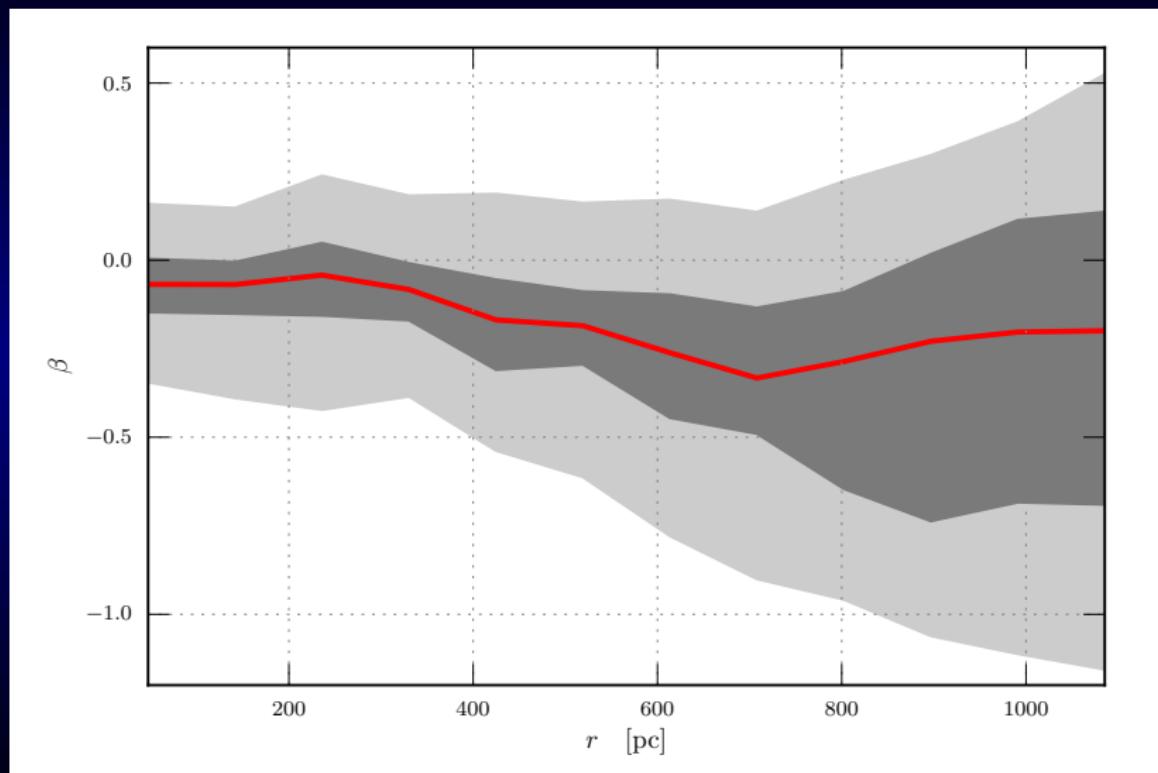
# Preliminary Result: Density Profile Triaxial System



# Preliminary Result: Fornax Dwarf Galaxy



# Preliminary Result: Velocity Anisotropy



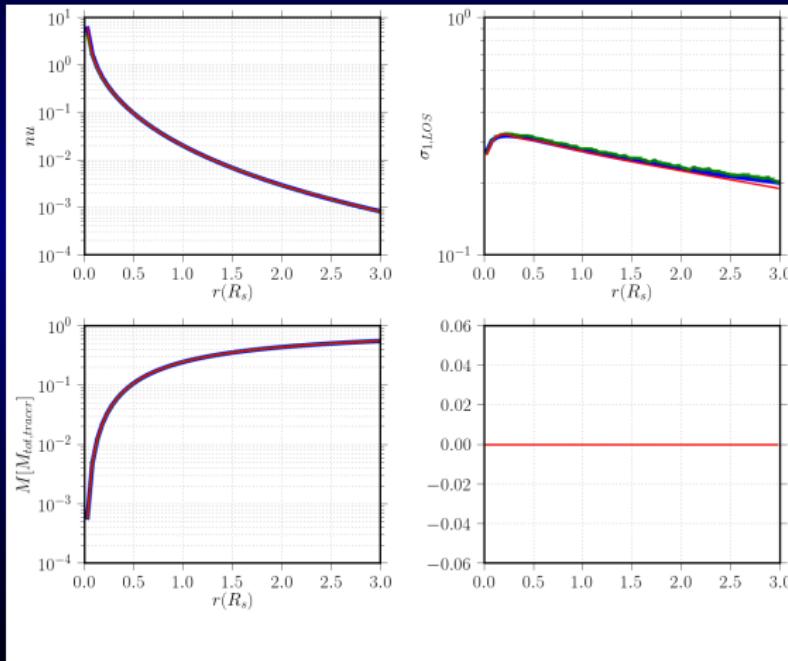
# Summary

- non-parametric method: model  $\rho$ ,  $\nu$ ,  $\beta$  in bins
- splitting by chemistry to break  $\beta, M$ -degeneracy
- dwarfs are potential places to detect dark matter annihilation signals

# Outlook

- application to real observed dwarfs
- modelling of binary motions
- comparison with dwarfs in NEC simulation

## Appendix: $\sigma_{\text{LOS}}$ integration



## Appendix: Deprojection

- work with 3D model, compare projected 2D values
- deproject, assuming spherical geometry

$$\nu = -\frac{1}{\pi} \int_R^\infty \frac{d\Sigma}{dR} \frac{dr}{\sqrt{R^2 - r^2}}$$

## Appendix: Application to Disc Geometry

- method in 1D  $z$ , working on  $K_z$
- potential dominated by baryons near disc plane  $\rightarrow$  baryon prior
- assumption: tilt term neglected