

orthogonal basis functions  
for  
kinematic modelling

a technical report

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# overview

complete set of bi-orthonormal basis functions

$$F_{nmk}(x, y, v) = S_n(R) e^{im\phi} \ell_k(v|R)$$

with  $(x, y)$  sky position and  $v$  line-of-sight velocity and

$$\delta_{nn'} \delta_{mm'} \delta_{kk'} = \int dx dy dv F_{nmk}(x, y, v) \bar{F}_{n'm'k'}(x, y, v)$$

$$\delta(x-x') \delta(y-y') \delta(v-v') = \sum_{nmk} F_{nmk}(x, y, v) \bar{F}_{nmk}(x', y', v')$$

allow to expand

$$F(x, y, v) = \sum_{nmk} C_{nmk} S_n(R) e^{im\phi} \ell_k(v|R)$$

with (e.g. for an  $N$ -body model)

$$C_{nmk} = \sum_i m_i \bar{F}_{nmk}(x_i, y_i, v_{zi})$$

# usage in dynamical modelling of discrete data

## 1. log-likelihood approach:

modify model to maximise  $\mathcal{L} = \sum_j \ln p_j$

with

$$p_j = F(x_j, y_j, v) *_v \exp\left(-\frac{(v - v_j)^2}{2\sigma_j^2}\right)$$

=> requires velocity error convolution ( $*_v$ )

## 2. generalised moment fitting:

modify model to minimise  $\chi^2 = \sum_{nmk} \left[ \frac{C_{nmk, \text{model}} - C_{nmk, \text{data}}}{\sigma_{nmk}} \right]^2$

with

$$C_{nmk, \text{data}} = \sum_j \bar{F}_{nmk}(x_j, y_j, v) \div_v \exp\left(-\frac{(v - v_j)^2}{2\sigma_j^2}\right)$$

=> requires velocity error de-convolution ( $\div_v$ )

# radial basis functions: Sersiclets

Sersic (1963) profile:

$$I_s(R) = \frac{s(n_s)}{2\pi R_0^2} e^{-b[R/R_0]^{1/n_s}}$$

ansatz for radial basis functions:

$$S_n(R) = \bar{S}_n(R) = I_s(R) P_n(\xi) \quad \text{with} \quad \xi = 2b[R/R_0]^{1/n_s}$$

gives the bi-orthogonality relation

$$\delta_{nn'} \propto \int_0^\infty d\xi \xi^\alpha e^{-\xi} P_n(\xi) P_{n'}(\xi) \quad \text{with} \quad \alpha = 2n_s - 1$$

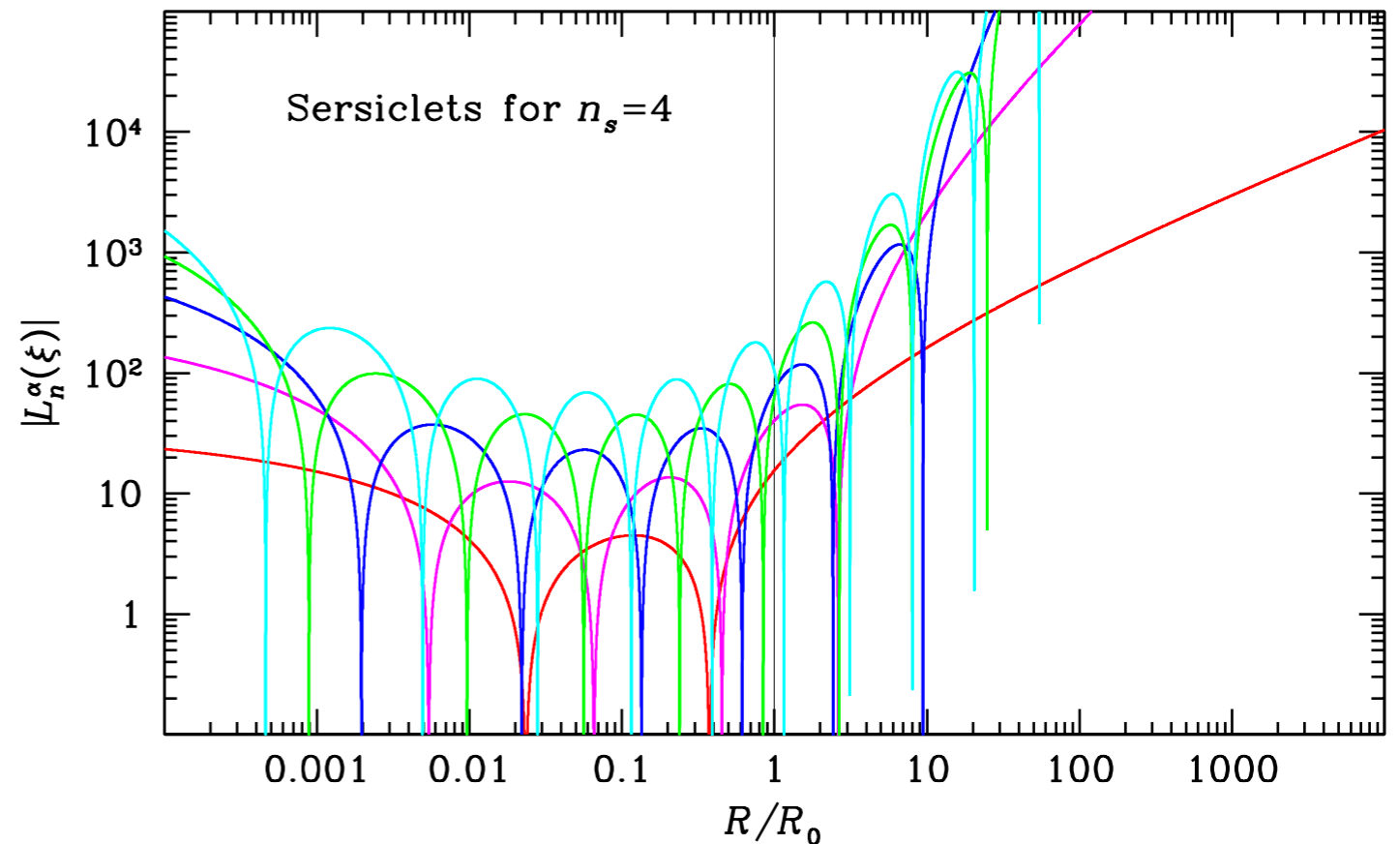
of the Laguerre polynomials

$$L_n^\alpha(x) = \frac{1}{n!} e^x x^{-\alpha} \frac{d}{dx} (e^{-x} x^{n+\alpha})$$

=> Sersiclets of Andrae, Melchior & Jahnke (2011)

$$S_n(R) = \bar{S}_n(R) \propto I_s(R) L_n^{2n_s-1}(\xi)$$

# radial basis functions: Sersiclets



problem:

too much resolution at  $R < R_0$

=> Andrae et al.: more complicated model for lowest order

=> requires fully numerical treatment

alternatively:

1 generalise 
$$I_\gamma(R) = \frac{s(n_s, \gamma)}{2\pi R_0^2} \left(\frac{R}{R_0}\right)^{-\gamma} e^{-b[R/R_0]^{1/n_s}}$$

2 allow 
$$S_n(R) \neq \bar{S}_n(R)$$

# radial basis functions: beyond Sersiclets

$$I_\gamma(R) = \frac{s(n_s, \gamma)}{2\pi R_0^2} \left(\frac{R}{R_0}\right)^{-\gamma} e^{-b[R/R_0]^{1/n_s}}$$

the ansatz:

$$S_n(R) = I_\gamma(R) P_n(\xi) \quad \text{and} \quad \bar{S}_n(R) = \xi^\beta e^{(1-c)\xi} S_n(R)$$

with  $\gamma > 0$  and  $2(1-\gamma)n_s + \beta > 0$

again leads to Laguerre polynomials:

$$S_n(R) \propto I_\gamma(R) L_n^{2(1-\gamma)n_s + \beta - 1}(c\xi)$$

=> more general lowest order (parameters  $R_0, n_s, \gamma$ )

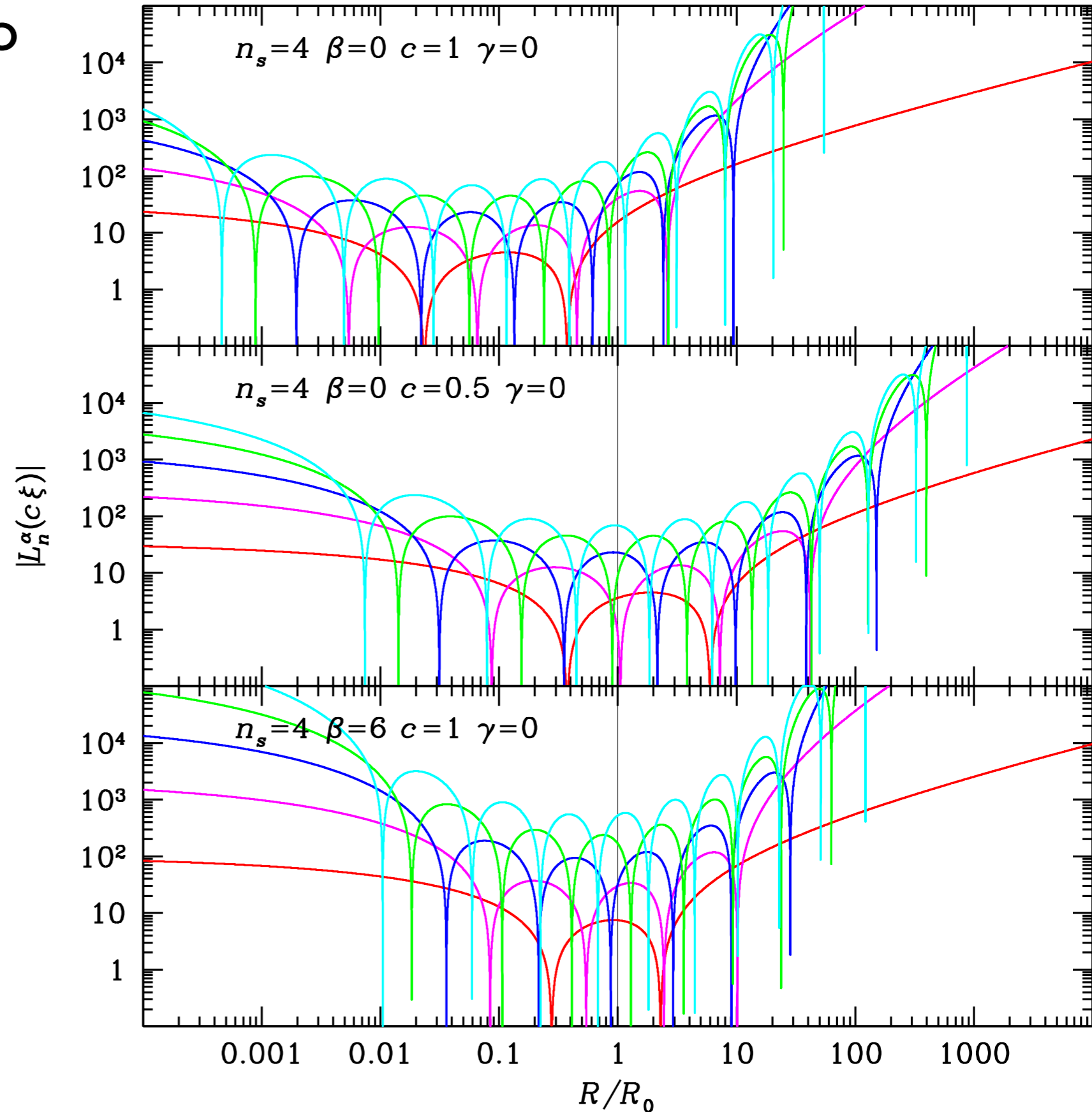
=> more flexible higher order (parameters  $c, \beta$ )

=> still fully analytical (recursive computation etc.)

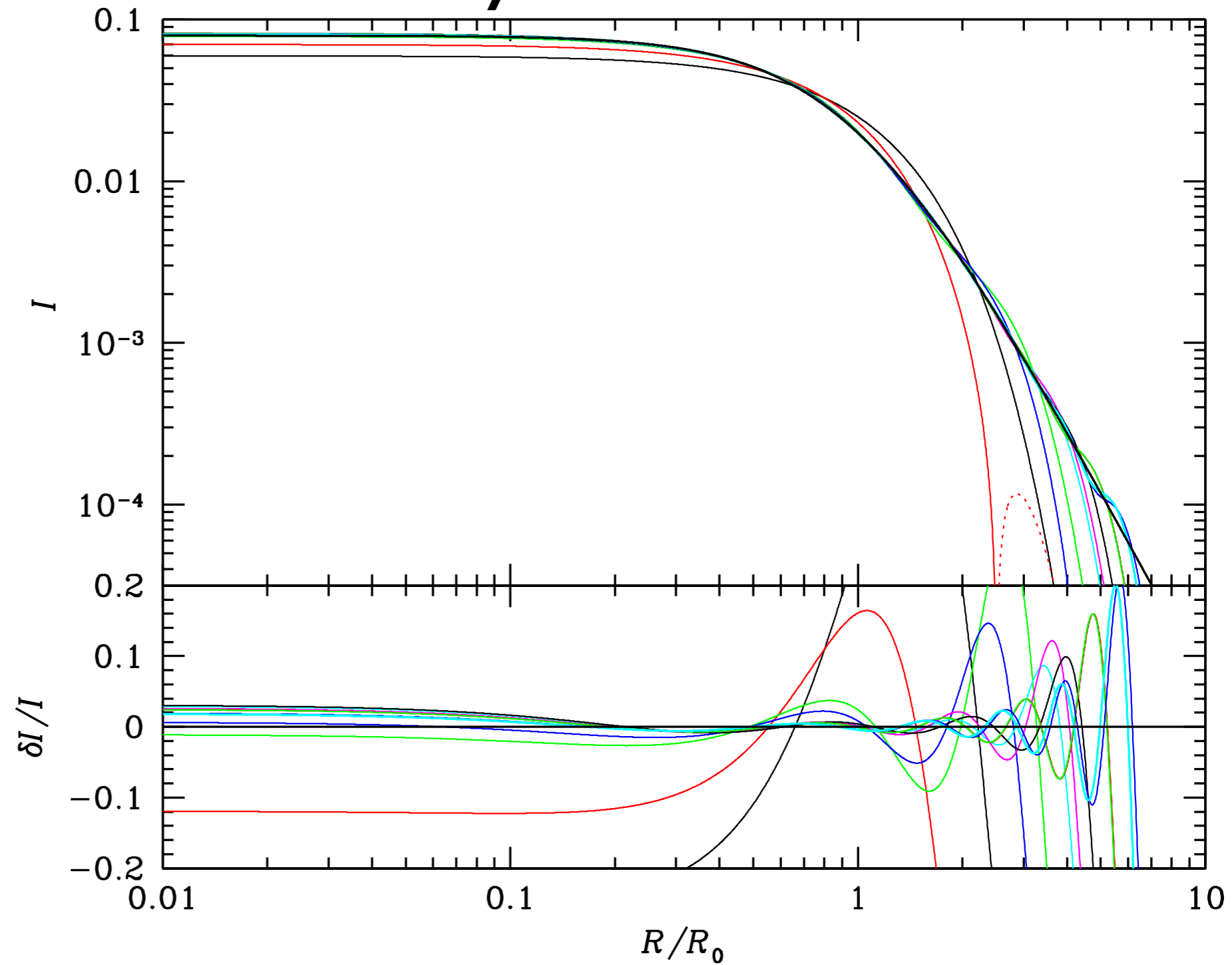
=> useful if truncation at large radii as in Sersic profile

# radial basis functions: beyond Sersiclets

new parameters allow to  
adapt resolution



# radial basis functions: beyond Sersiclets



fit of Plummer with Sersiclets ( $n_s = 0.6, c = 1, \beta = 0, \gamma = 0$ )



# radial basis functions: double power law models

double power law model:

$$I_p(R) \propto \left(\frac{R}{R_0}\right)^{-\gamma_0} \left(\left[\frac{R}{R_0}\right]^\eta + 1\right)^{(\gamma_0 - \gamma_\infty)/\eta}$$

ansatz:

$$S_n(R) = I_p(R) P_n(\xi) \quad \text{and} \quad \bar{S}_n = Z(\xi) S_n(R)$$

with

$$\xi \equiv \frac{R^\eta - R_0^\eta}{R^\eta + R_0^\eta}$$

gives the bi-orthogonality relation

$$\delta_{nn'} \propto \int_{-1}^1 d\xi (1+\xi)^{\frac{2(1-\gamma_0)}{\eta}-1} (1-\xi)^{\frac{2(\gamma_\infty-1)}{\eta}-1} Z(\xi) P_n(\xi) P_{n'}(\xi)$$

For

$$Z(\xi) = (1-\xi)^{\alpha_0} (1+\xi)^{\beta_0} = 2^{\alpha_0+\beta_0} \left(\frac{R}{R_0}\right)^{\eta\beta_0} \left(\left[\frac{R}{R_0}\right]^\eta + 1\right)^{-\alpha_0-\beta_0}$$

# radial basis functions: double power law models

the bi-orthogonality relation becomes

$$\delta_{nn'} \propto \int_{-1}^1 d\xi (1+\xi)^\alpha (1-\xi)^\beta P_n(\xi) P_{n'}(\xi)$$

with  $\alpha = 2(\gamma_\infty - 1)/\eta - 1 + \alpha_0$  and  $\beta = 2(1 - \gamma_0)/\eta - 1 + \beta_0$

bi-orthogonality relation of Jacobi polynomials

$$P_n^{\alpha,\beta}(x) = \frac{(-1)^n}{2^n n!} (1-x)^{-\alpha} (1+x)^{-\beta} \frac{d}{dx} (1-x)^{\alpha+n} (1+x)^{\beta+n}$$

with  $\alpha, \beta > -1$ , i.e.

$$\alpha_0 > 2(1 - \gamma_\infty)/\eta \quad \beta_0 > 2(\gamma_0 - 1)/\eta$$

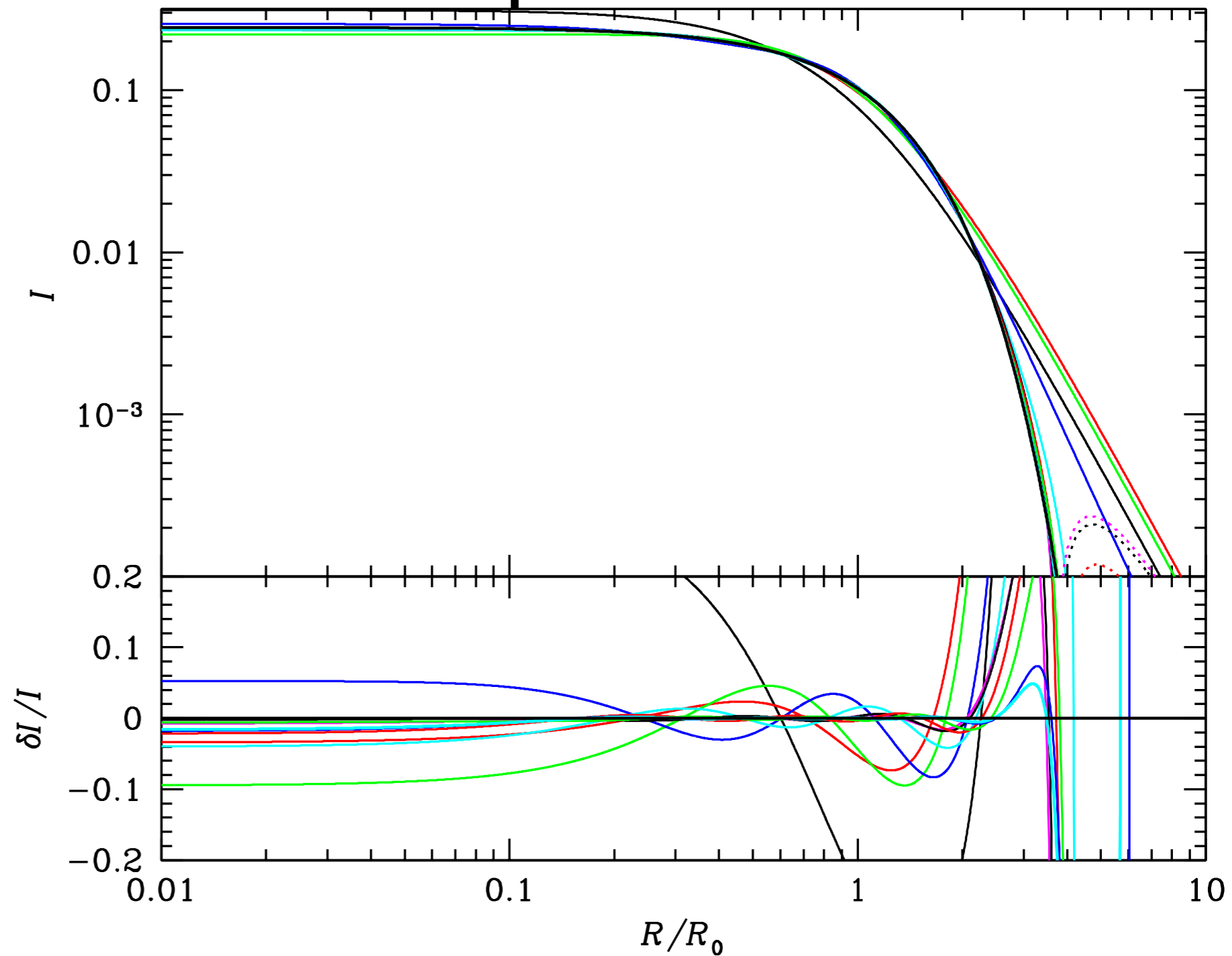
thus  $S_n(R) = I_p(R) P_n^{\alpha,\beta}(\xi)$

=> lowest-order parameters:  $R_0, \gamma_0, \gamma_\infty, \eta$

=> higher-order parameters:  $\alpha_0, \beta_0$

=> useful for power-law fall-off

# radial basis functions: double power law models



fit Sersic model ( $n_s = 0.6$ ) with double-power-law models based on Plummer ( $\gamma_0 = 0, \gamma_\infty = 4, \eta = 2$ ) with  $\alpha_0 = \beta_0 = 0$

# azimuthal harmonics

complex harmonics  $\exp(im\phi)$ : computationally awkward

trigonometric harmonics  $\cos m\phi, \sin m\phi$ : special case  $m = 0$

=> use  $\text{cas}(x) \equiv \cos x + \sin x$

then

$$\int_0^{2\pi} d\phi \text{cas } m\phi \text{cas } m'\phi = 2\pi\delta_{mm'}$$

=> no complex numbers, no special cases, self-conjugate

(basis of Hartley transform: real-valued alternative to Fourier)

# velocity profile: Gauß-Hermite

well-known from LOSVD modelling

$$l_k(v) \propto H_k(\zeta) e^{-\zeta^2/2} \quad \text{with} \quad \zeta \equiv (v - v_0)/\sigma_0$$

error convolved basis functions

$$\tilde{l}_k(v_j, \sigma_j) = \int_{-\infty}^{\infty} dv e^{-\frac{(v-v_j)^2}{2\sigma_j^2}} l_k(v)$$

obey recursion relation (no need for numerics)

error de-convolution also possible analytically

=> useful for log-likelihood & moment fitting

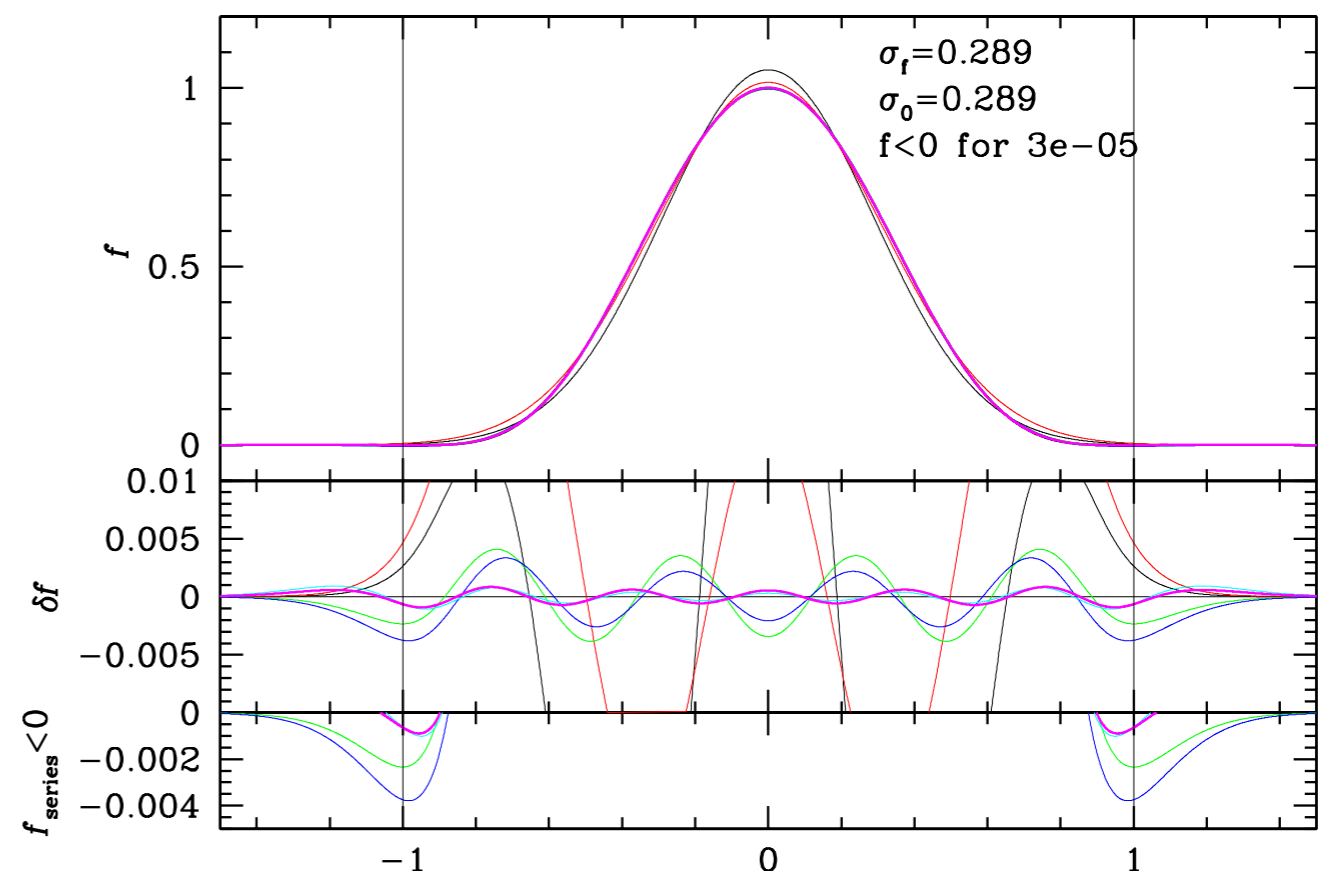
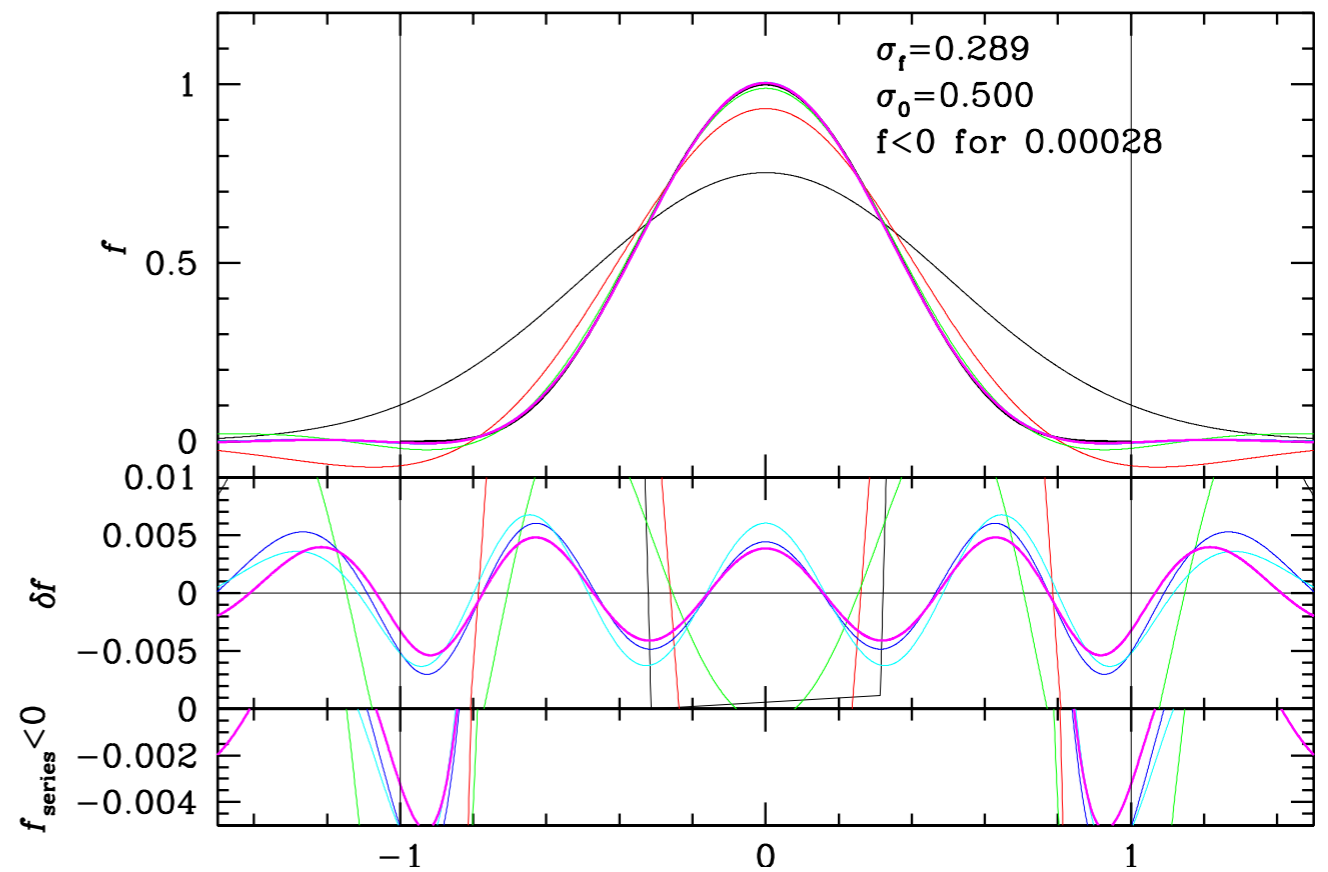
# velocity profile: Gauß-Hermite

expanding  $f(v) = (1 - v^2)^{9/2}$

expansion may obtain  $f < 0$

expansion has  $f \neq 0$

outside escape velocity



# velocity profile: Gauß-Hermite

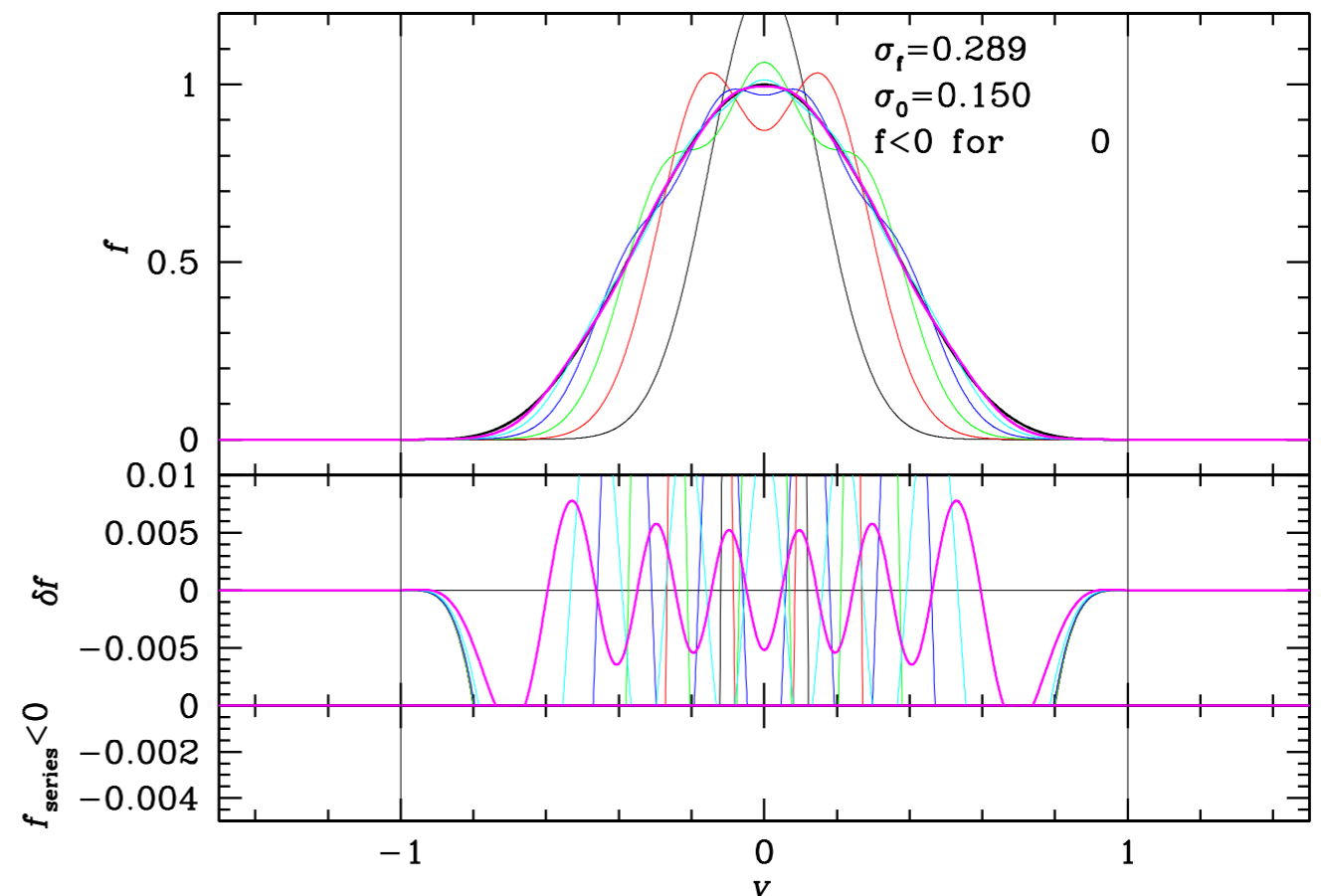
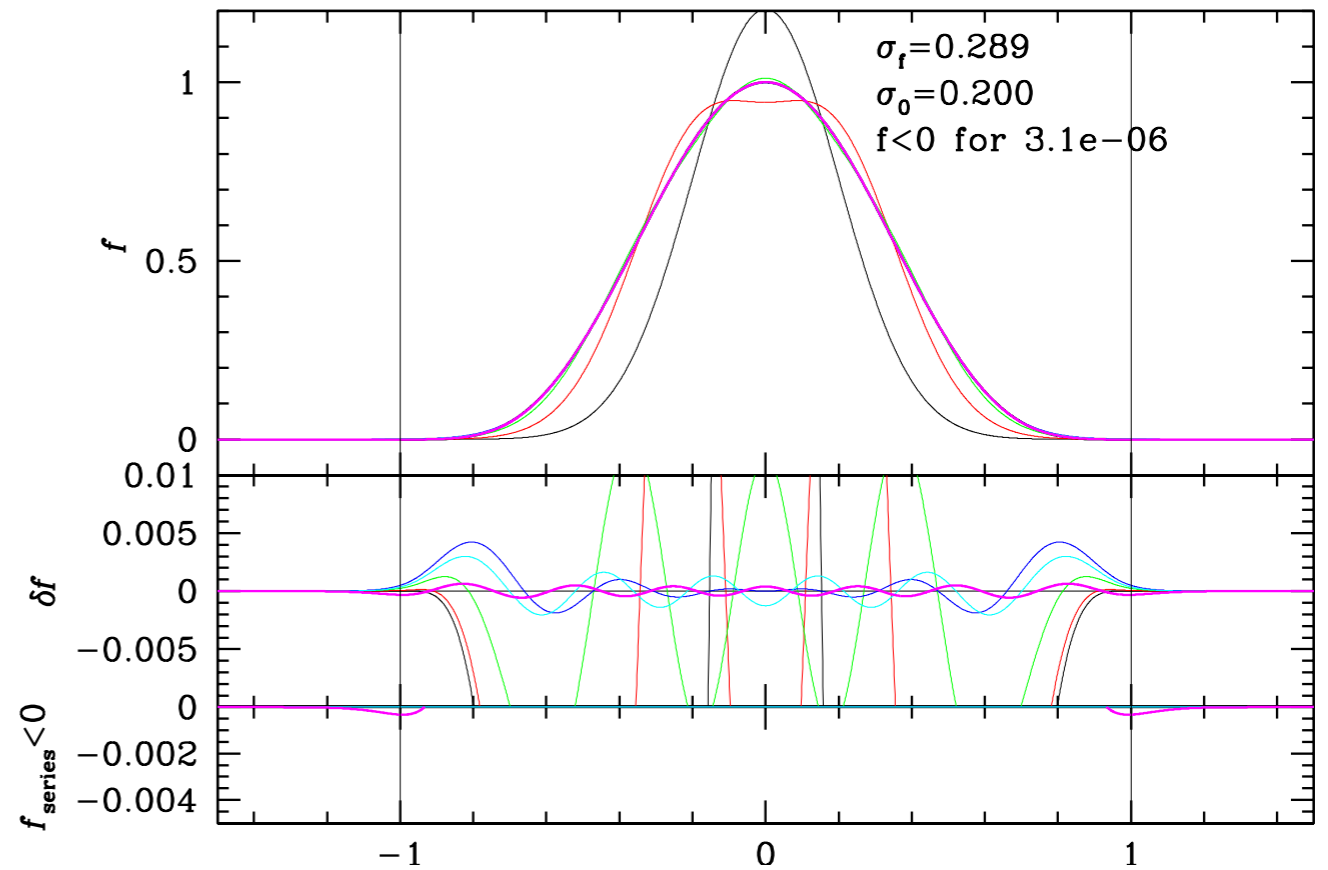
expanding  $f(v) = (1 - v^2)^{9/2}$

expansion may obtain  $f < 0$

expansion has  $f \neq 0$

outside escape velocity

depending on parameters



# velocity profile: powers

basis functions

$$l_k(v) \propto (1-u)^{\alpha/2} (1+u)^{\beta/2} P_k^{\alpha\beta}(u) \quad \text{for } u \equiv v/v_e \in [-1, 1]$$

lowest order has mean & dispersion velocity

$$\bar{v} = \frac{\beta - \alpha}{\alpha + \beta + 4} v_e \quad \text{and} \quad \sigma^2 = \frac{8(\alpha + 2)(\beta + 2)}{(\alpha + \beta + 4)^2(\alpha + \beta + 6)} v_e^2$$

which can be inverted to give

$$\alpha, \beta = \frac{(v_e^2 - \bar{v}^2)(v_e \mp \bar{v}) - (3v_e \mp \bar{v})\sigma^2}{v_e \sigma^2}$$

=> parameters  $v_e, \bar{v}, \sigma$

=> zero outside escape velocity

=> error convolution must be done numerically

=> error de-convolution impossible



# Mass profile of Fornax dSph constraints from its GCs

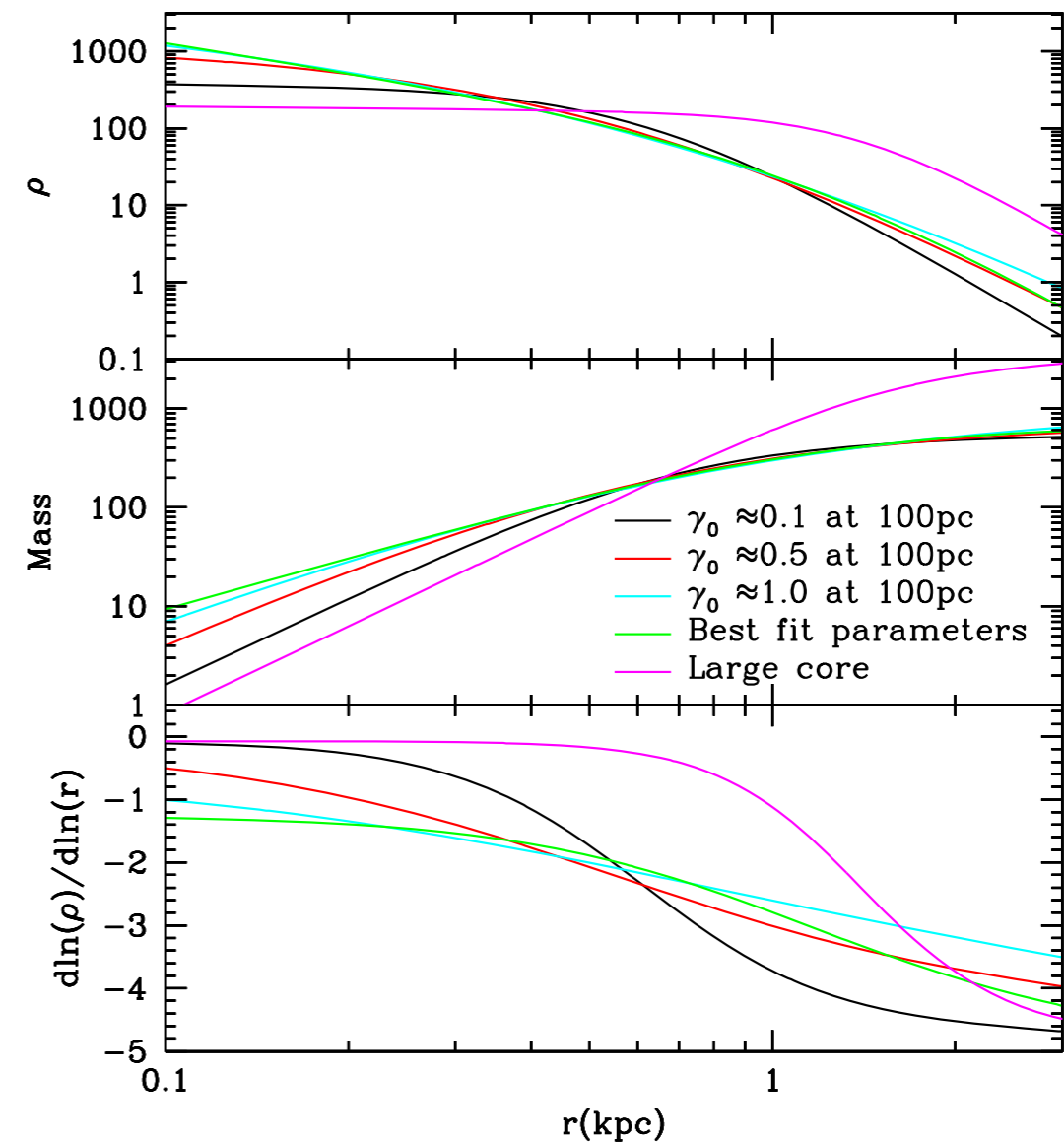
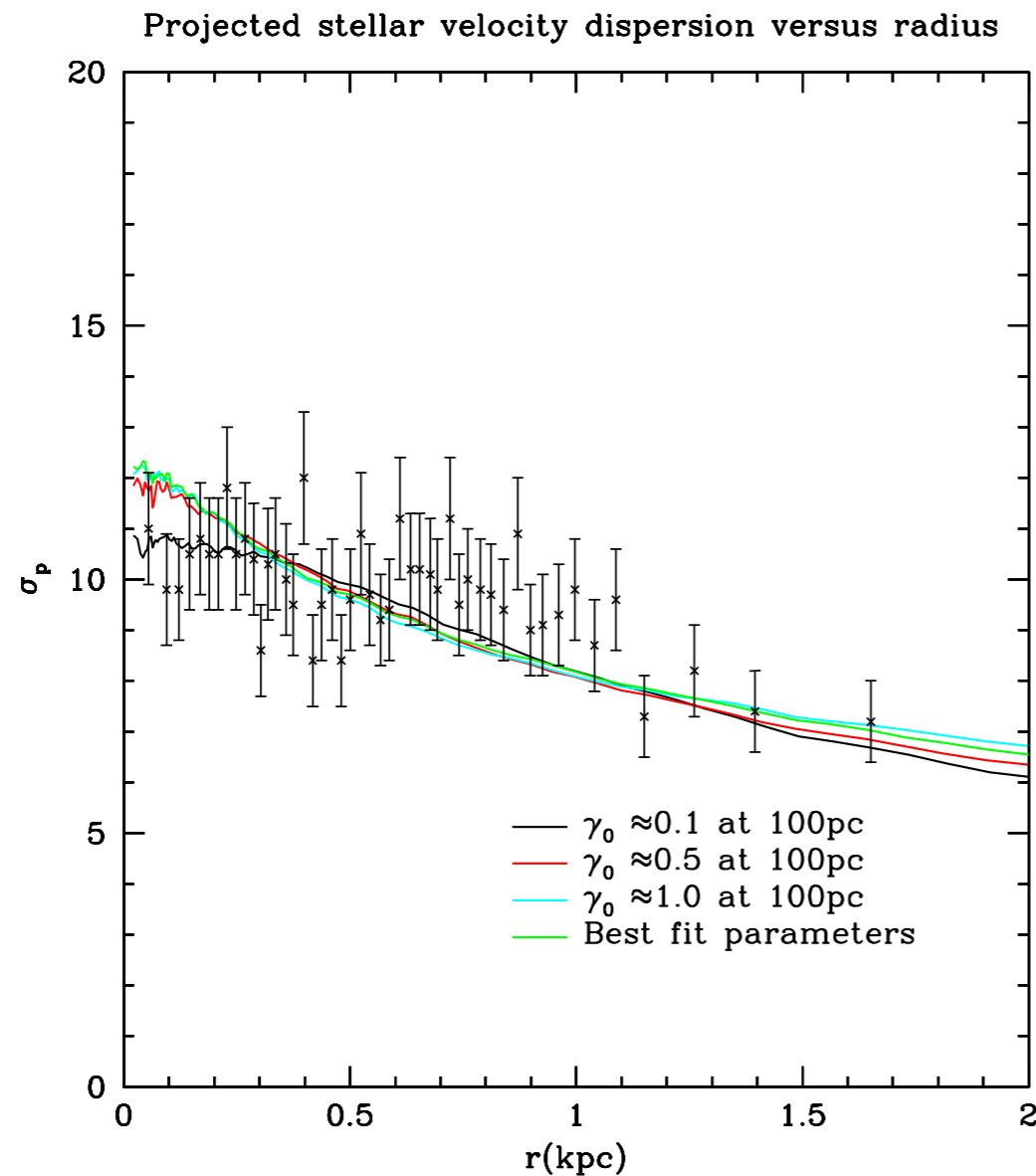
with Mark Wilkinson & David Cole

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# DM profile of Fornax dSph

with D. Cole, J. Read  
& M. Wilkinson

- modelling dynamical friction on Fornax 5 GCs
- assume 5 plausible halo models

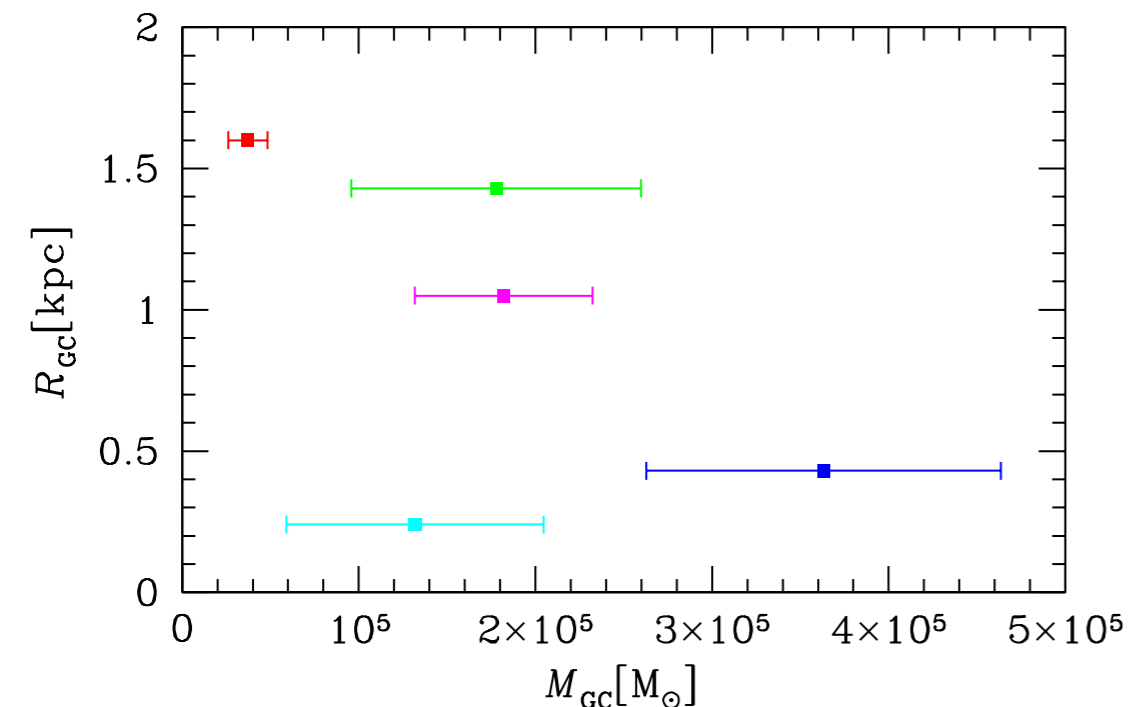


- normalise models by stellar velocity dispersion (no fit)
- cored model as suggested by Walker & Peñarrubia (2011)

# DM profile of Fornax dSph

with D. Cole, J. Read  
& M. Wilkinson

- modelling dynamical friction on Fornax 5 GCs
- assume 5 plausible halo models
- GC consistent with stellar distribution
- lightest GC furthest away  $\rightarrow$  dynamical friction at work
- for each GC: assume line-of-sight position  $z \in [0, 2\text{kpc}]$
- sky velocities assuming  $\beta = -0.33$   $\sigma = 10.5$  km/s
- many (700) simulations per halo model



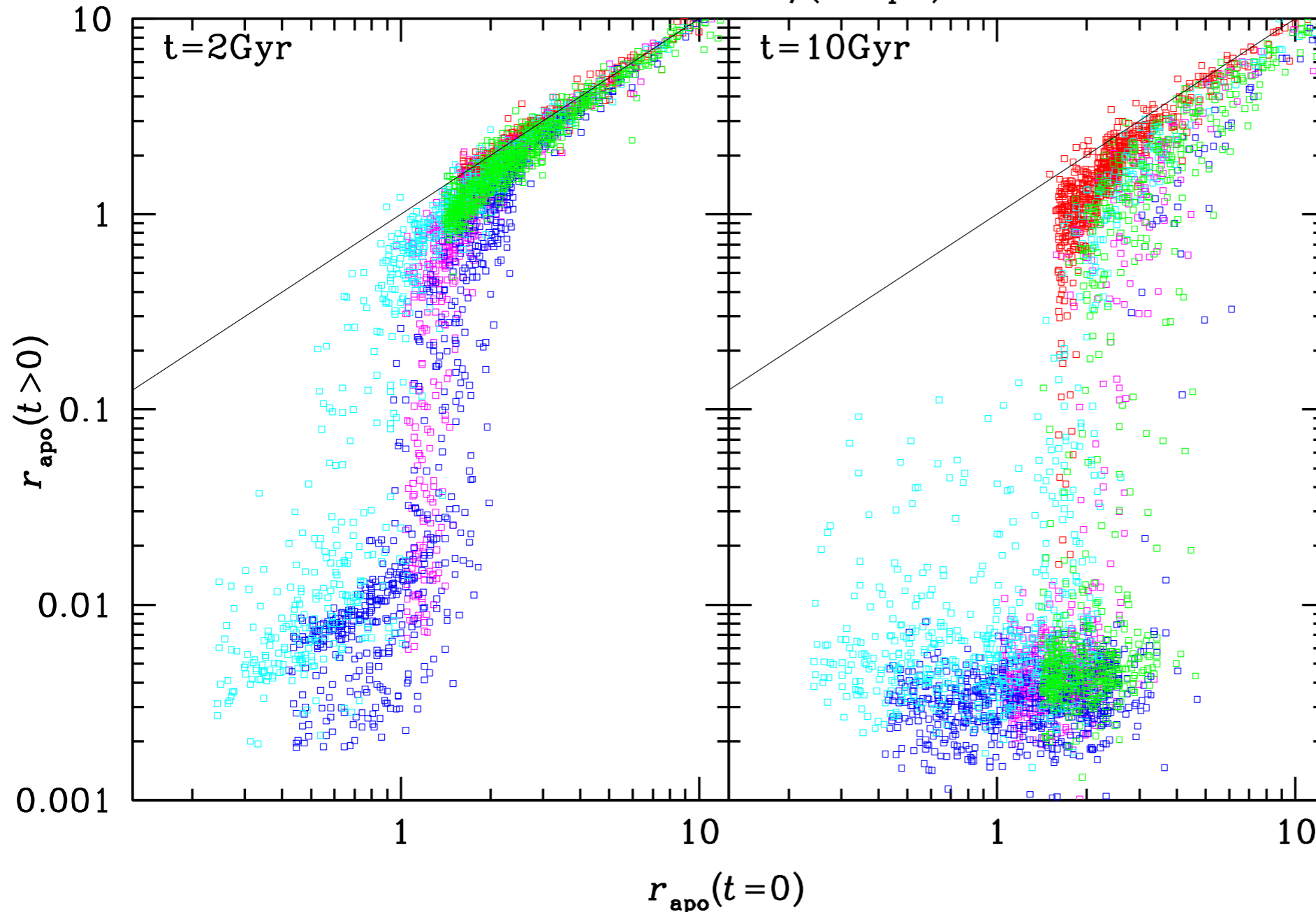
GC	$\log M_{GC}$ ( $M_{\odot}$ ) <sup>a</sup>	$M_{GC}$ ( $10^5 M_{\odot}$ ) <sup>a</sup>	$r_c^1$ (pc) <sup>a</sup>	$r_p$ (kpc) <sup>a</sup>	$r_{los}$ (kpc)	$v_{los}$ ( $\text{km s}^{-1}$ ) <sup>d</sup>
Fornax	$8.15^{+0.19e}_{-0.37}$	$1420^e$	<b>668<sup>e</sup></b>	-	$137 \pm 13^{b,f}$ $138 \pm 8^g$	0
1	$4.57 \pm 0.13$	0.37	10.03	<b>1.6</b>	$130.6 \pm 3.0^b$	-
2	$5.26 \pm 0.12$	1.82	5.81	1.05	$136.1 \pm 3.1^b$	$-1.2 \pm 4.6$
3	$5.56 \pm 0.12$	3.63	1.60	0.43	$135.5 \pm 3.1^b$	$7.1 \pm 3.9$
4	$5.12 \pm 0.24$	1.32	1.75	0.24	$134 \pm 6^c$	$5.9 \pm 3.4$
5	$5.25 \pm 0.20$	1.78	1.38	<b>1.43</b>	$140.6 \pm 3.2^b$	$8.7 \pm 3.6$

# DM profile of Fornax dSph

with D. Cole, J. Read  
& M. Wilkinson

- modelling dynamical friction on Fornax 5 GCs
- results for cuspy and cored halo models

'best-fit' model with  $\gamma(100\text{pc})=1.3$

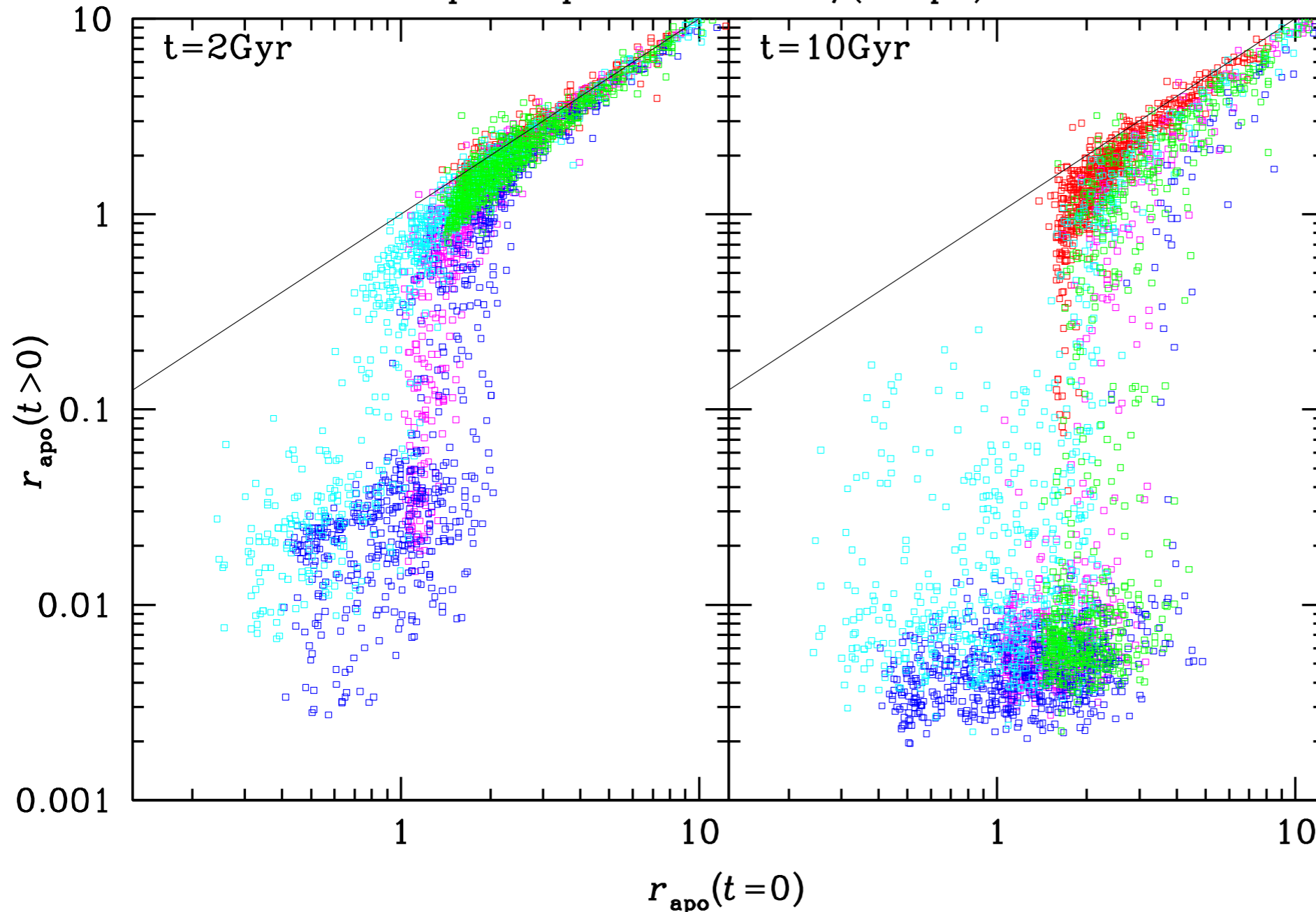


# DM profile of Fornax dSph

with D. Cole, J. Read  
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- modelling dynamical friction on Fornax 5 GCs
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steep-cusp model with  $\gamma(100\text{pc})=1.0$

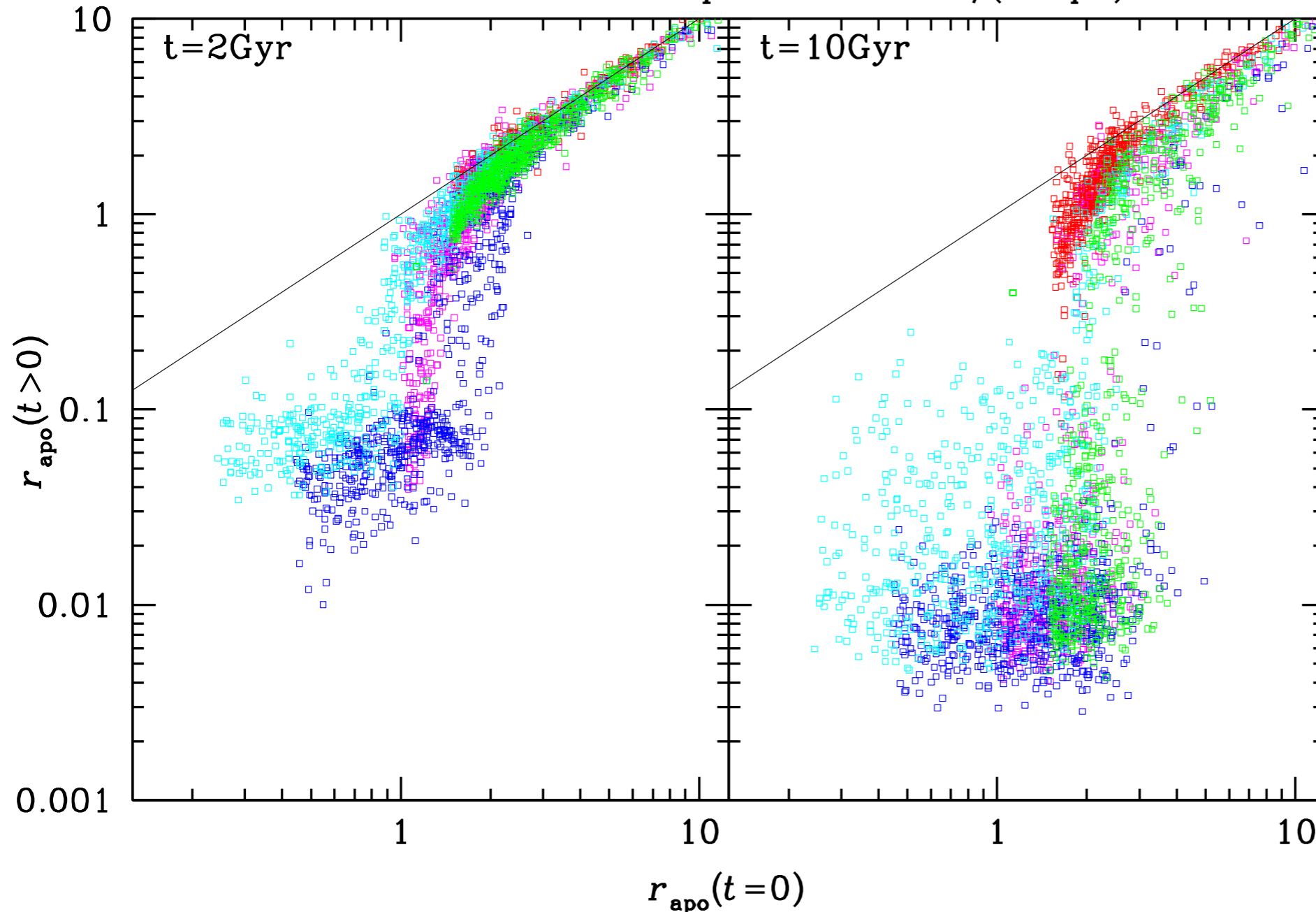


# DM profile of Fornax dSph

with D. Cole, J. Read  
& M. Wilkinson

- modelling dynamical friction on Fornax 5 GCs
- results for cuspy and cored halo models

intermediats-cusp model with  $\gamma(100\text{pc})=0.5$

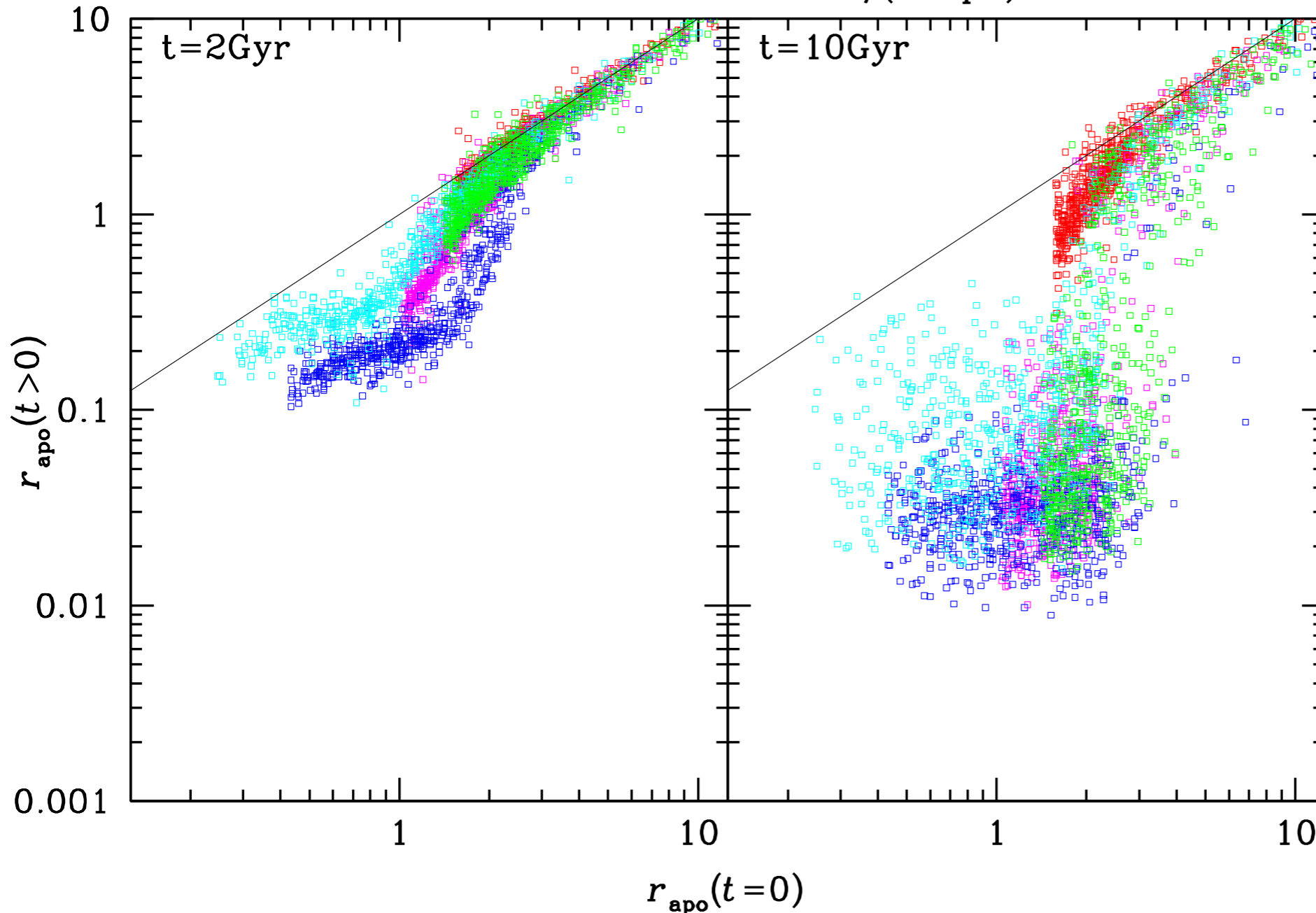


# DM profile of Fornax dSph

with D. Cole, J. Read  
& M. Wilkinson

- modelling dynamical friction on Fornax 5 GCs
- results for cuspy and cored halo models

shallow-core model with  $\gamma(100\text{pc})=0.1$

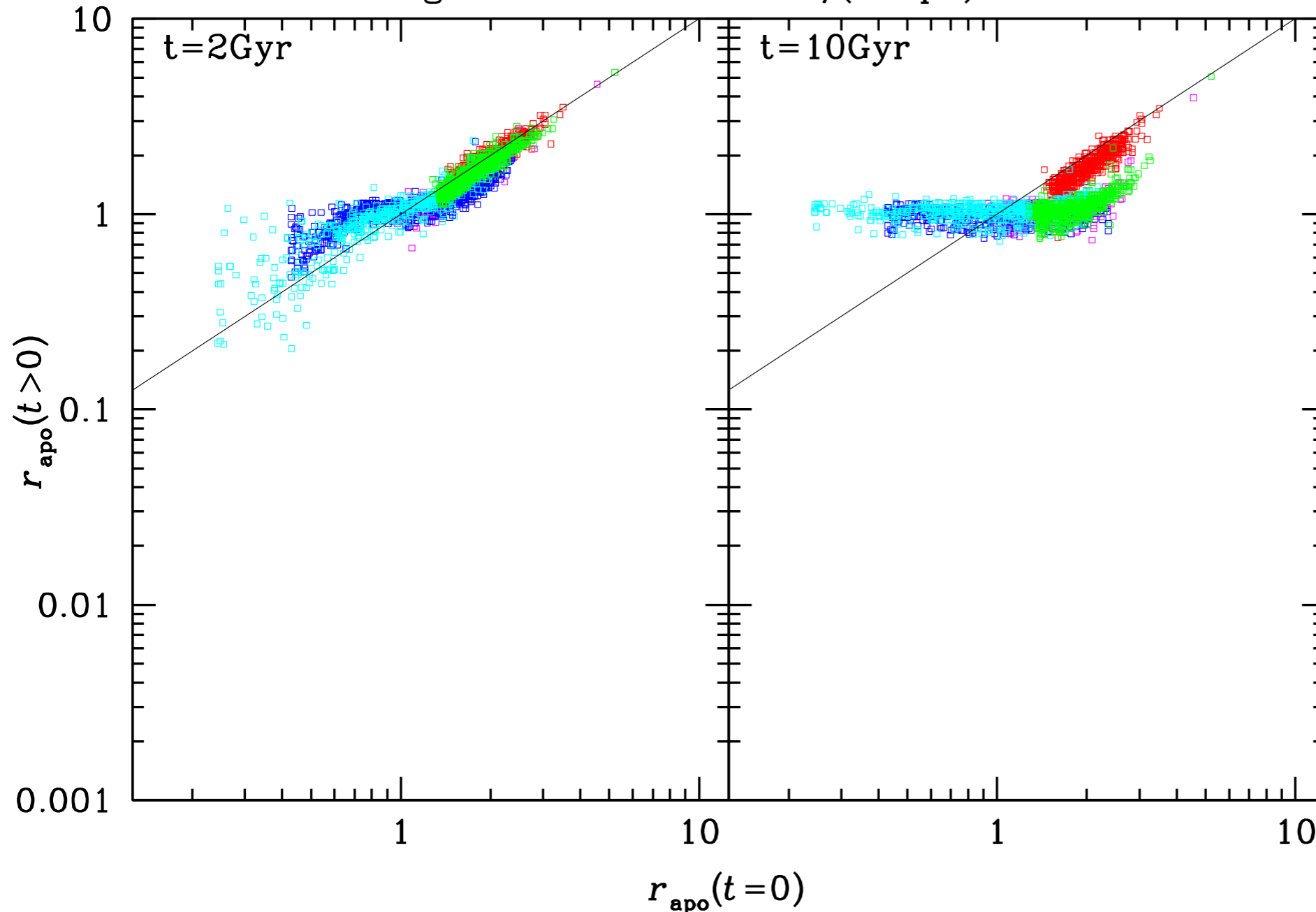


# DM profile of Fornax dSph

with D. Cole, J. Read  
& M. Wilkinson

- modelling dynamical friction on Fornax 5 GCs
- results for cuspy and cored halo models

large-core model with  $\gamma(100\text{pc})=0.1$





# DM profile of Fornax dSph

with D. Cole, J. Read  
& M. Wilkinson

- modelling dynamical friction on Fornax 5 GCs
- for cuspy halo models:
  - massive GCs sink into core of Fornax in  $\approx 2$  Gyr
  - either Fornax has no cuspy halo
  - or GCs have just arrived (would expect more M-segratation)
  - or GCs are near peri-centre of their orbits
- for shallow cored halo models:
  - in 2Gyr massive GCs sink by factor  $\sim 3-4$  for most orbits
  - Fornax may have a shallow core & GCs are sinking slightly
  - GCs have been farther out in past
- for large-core halo (very flat inner profile):
  - GCs don't sink ('dynamical buoyancy')
  - GCs have settled at edge of core (would not expect M-seg.)