

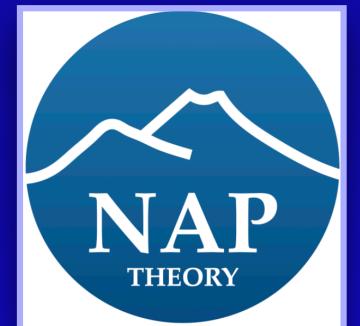
The Dark Matter distribution of the Milky Way

(its uncertainties and their effects on the determination of new physics)

Fabio Jocco

Università Federico II, NAPOLI

PASCOS 2025
Durham, July 22nd



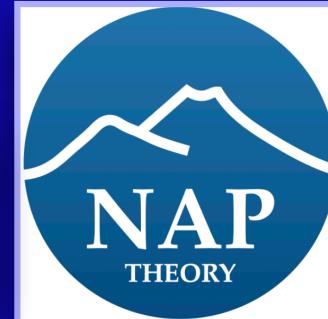
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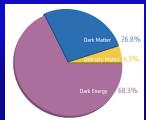
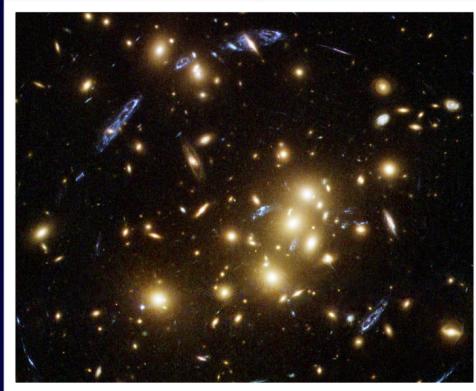
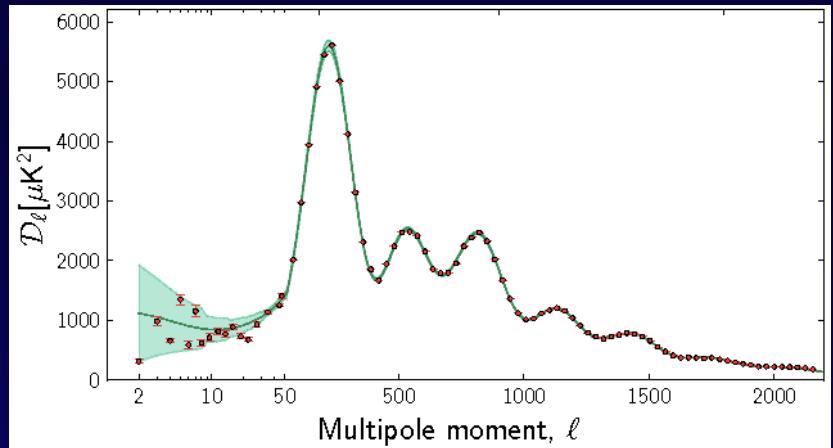
Università Federico II, NAPOLI

PASCOS 2025
Durham, July 22nd



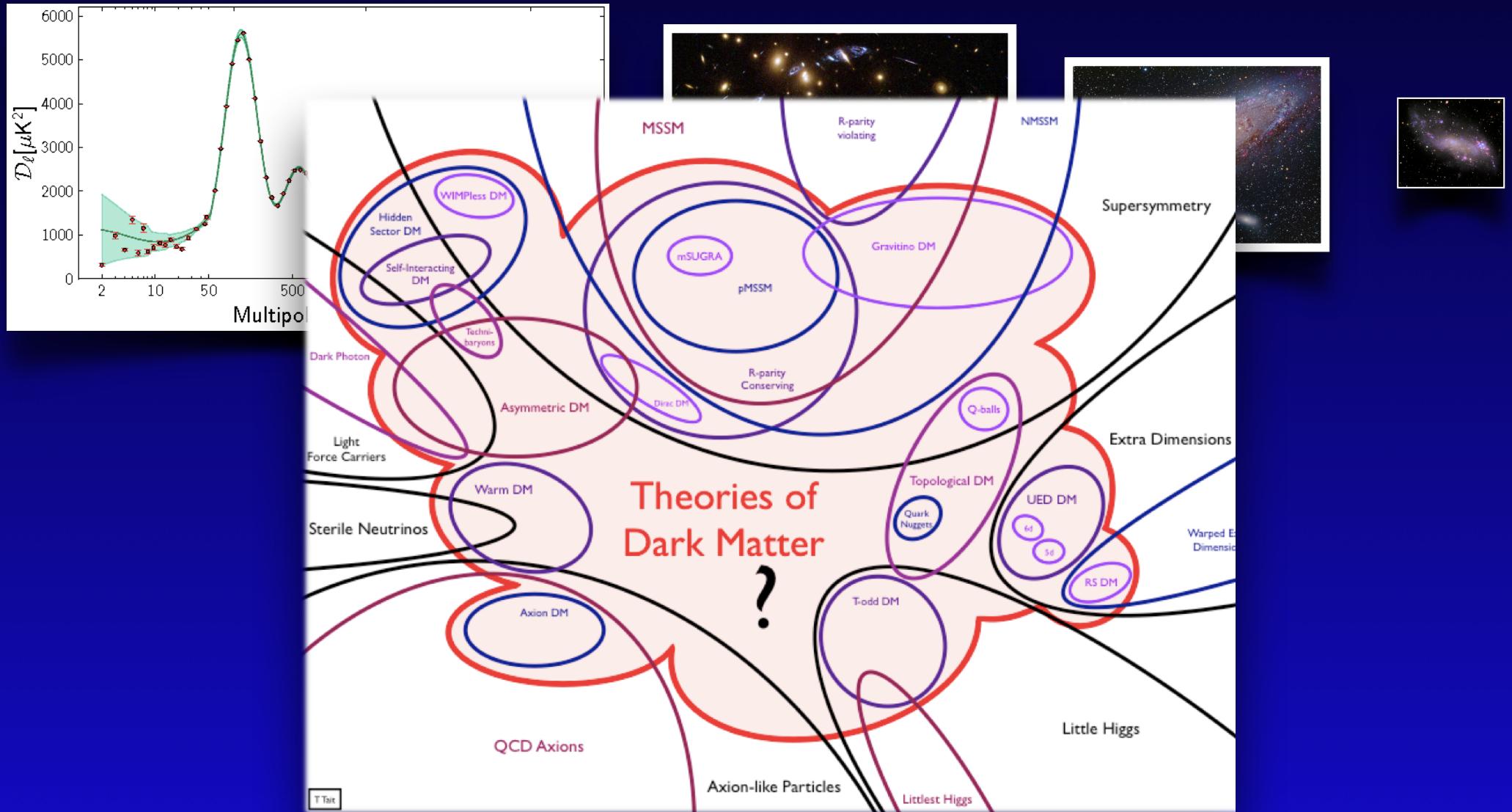
A story of \mathcal{LCDM}

chapter I: evidence on diverse scales



A story of Λ CDM

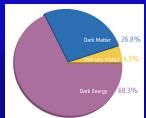
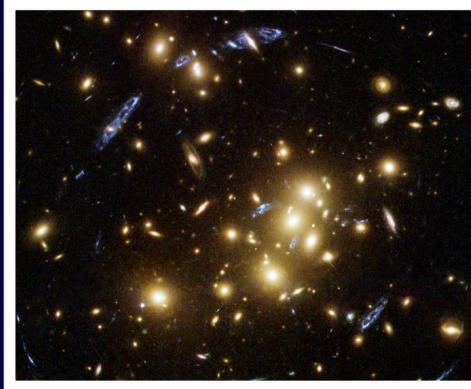
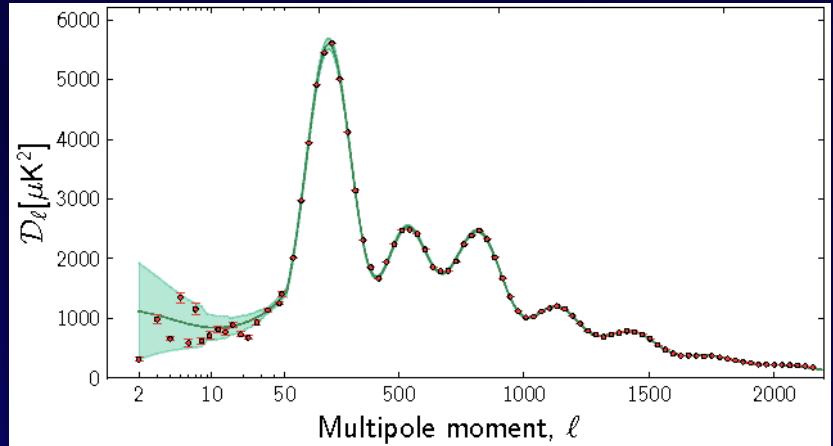
chapter I: evidence on diverse scales



NATURE STILL UNKNOWN

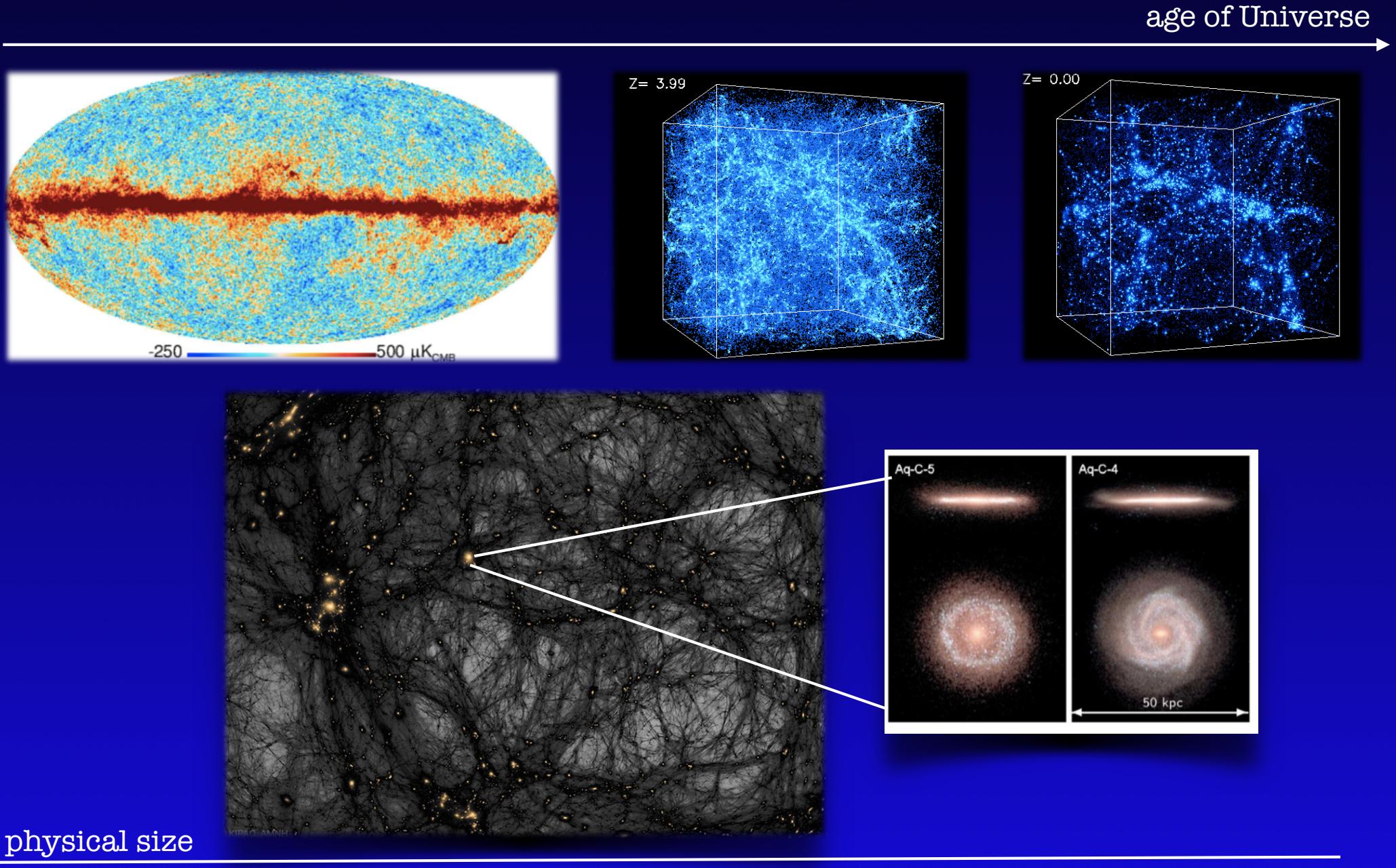
A story of \mathcal{LCDM}

chapter I: evidence on diverse scales



A story of Λ CDM

chapter II: structure formation



Milky Way or 银河系

this is how it looks like:



The origin of the Milky Way



[Jacopo Tintoretto, ca 1575. The National Gallery, London]

The origin of the Milky Way



[Peter Paul Rubens, ca 1636. Museo del Prado, Madrid]

What is the actual distribution of DM in the Milky Way?



And if you care about the proximity of the Sun?

Synergic searches of WIMP DM (*Colliders*, “*direct*”, “*indirect*”)

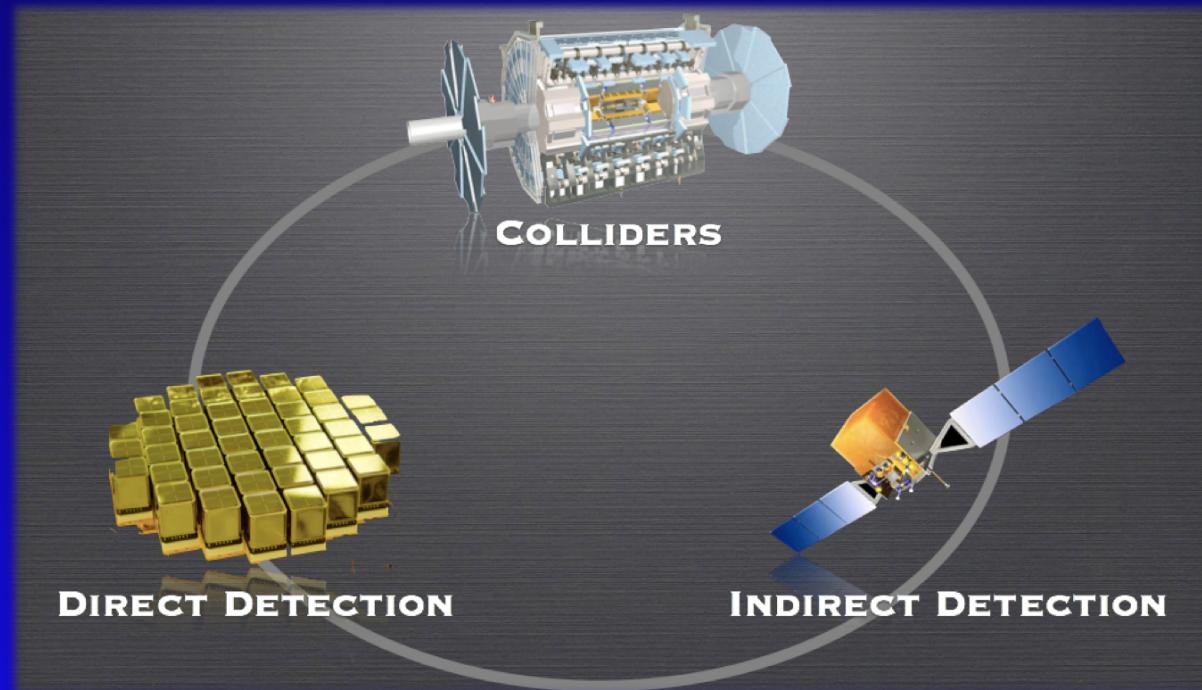
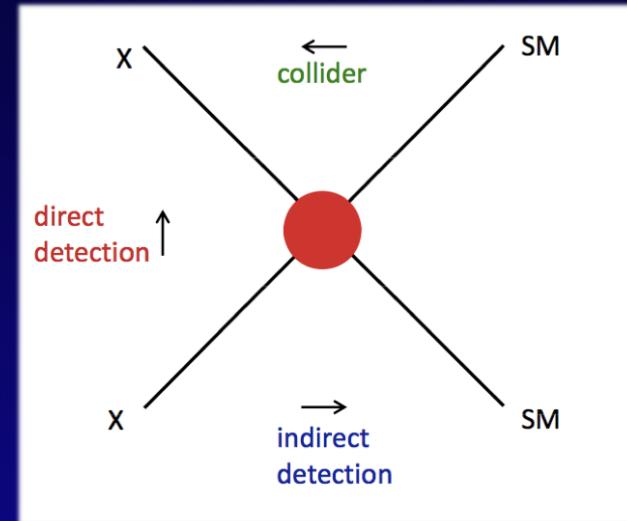
Direct detection:

DM scattering against nuclei, recoil

Indirect detection:

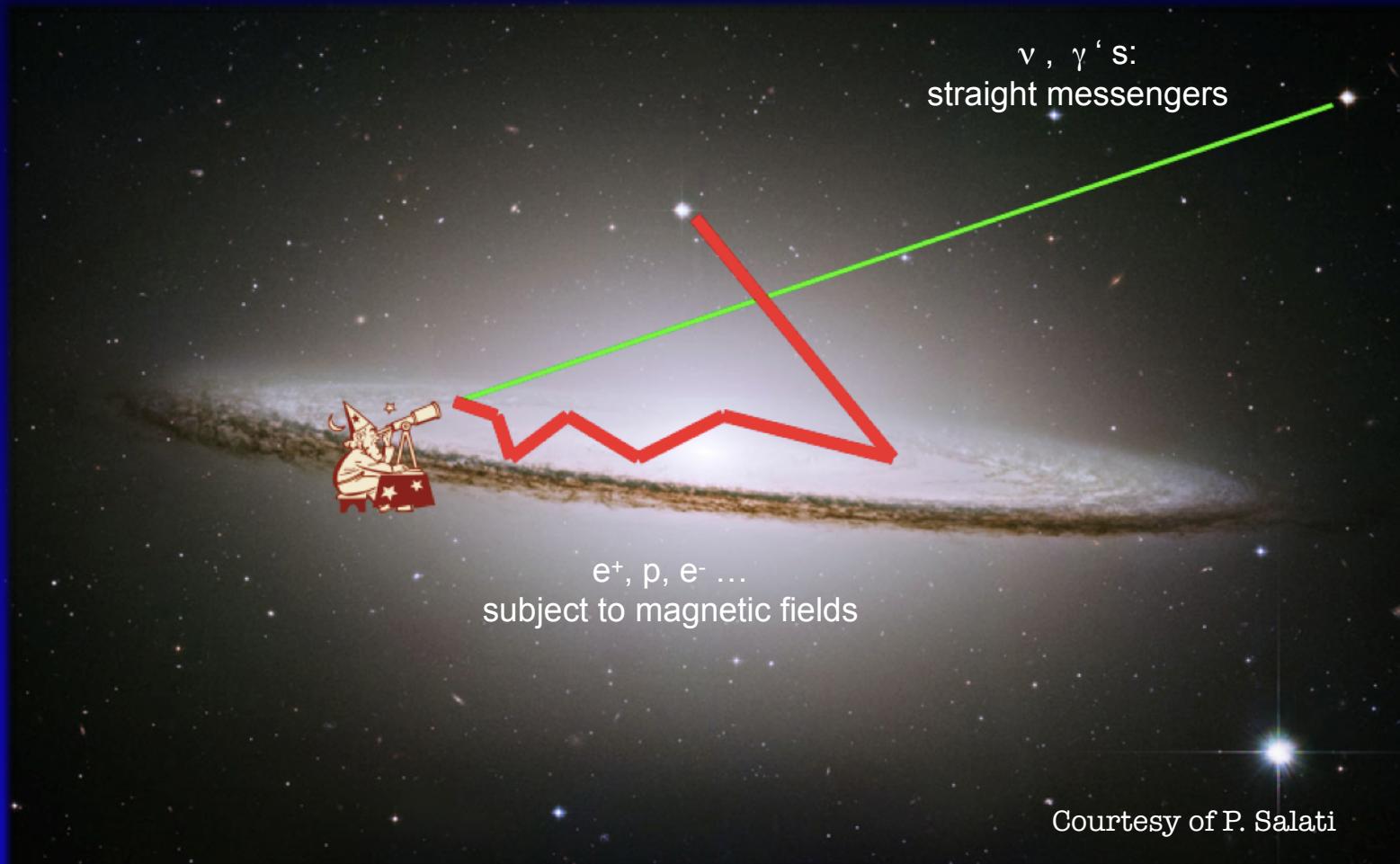
Annihilation in astrophysical envir.
Observation of SM products of annih.

Production at LHC



Indirect Detection: principles and dependencies

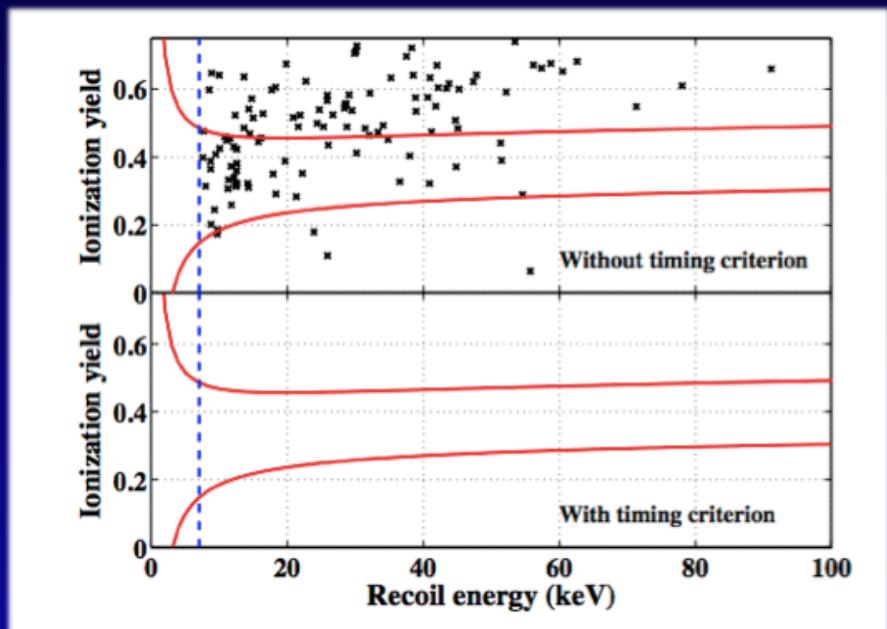
$$\chi + \chi \rightarrow q\bar{q}, W^+W^-, \dots \rightarrow \gamma, \bar{p}, \bar{D}, e^+ \& \nu's$$



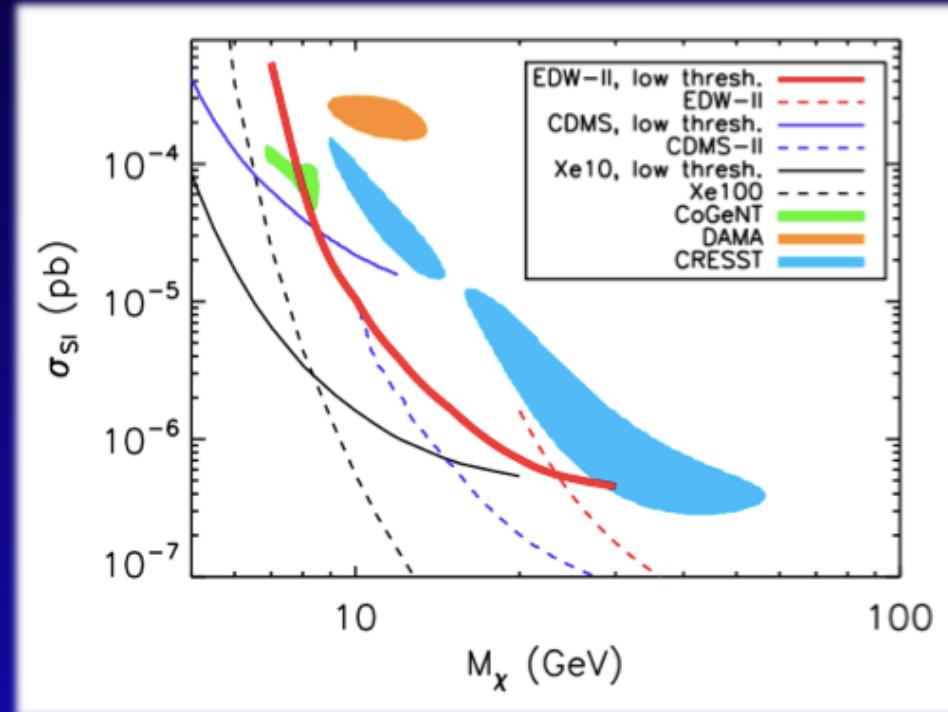
$$F_i \propto \frac{1}{4\pi d^2} B_i \frac{\langle \sigma v \rangle}{m_\chi} \int \rho^2(r) dV$$

Direct Detection: principles and dependencies (to go...)

from this



to this

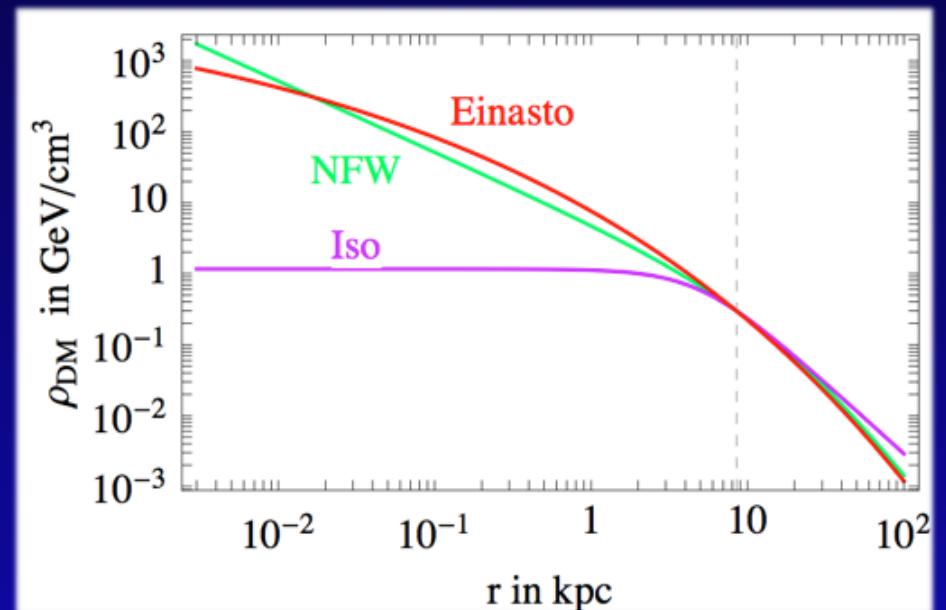
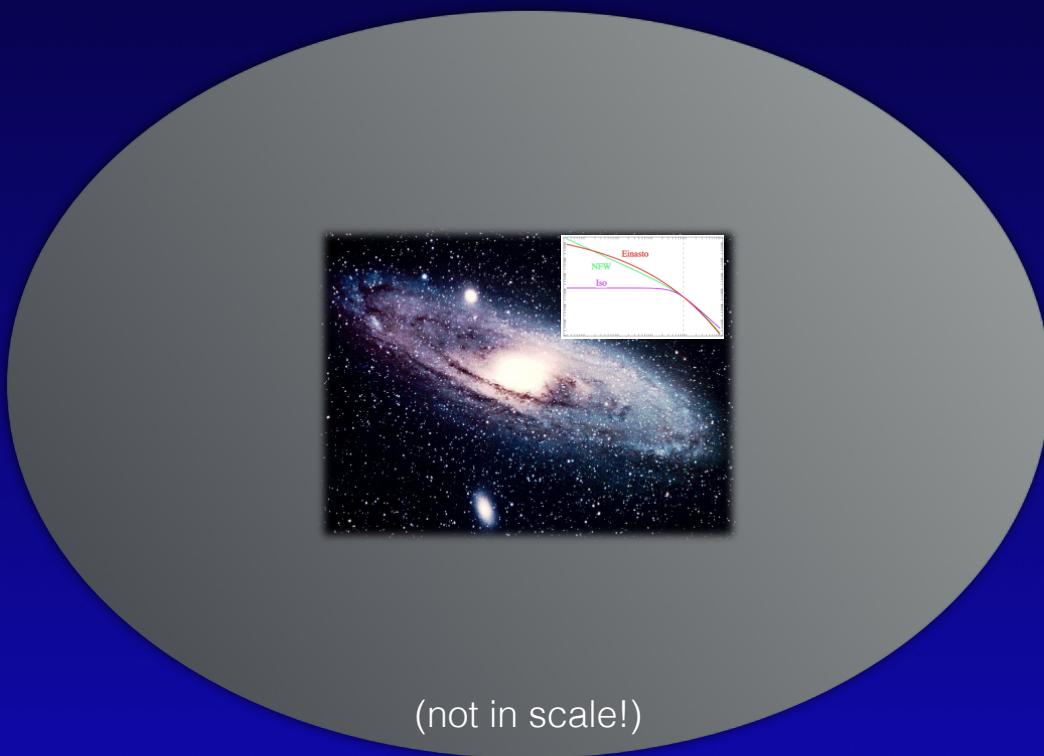


you need this

$$\frac{dR}{dE} \propto \frac{1}{\mu^2} \frac{\sigma_\chi}{m_\chi} \rho_0 \eta(v, t)$$

A story of Λ CDM chapter III: the single halo

A “universal” DM profile?

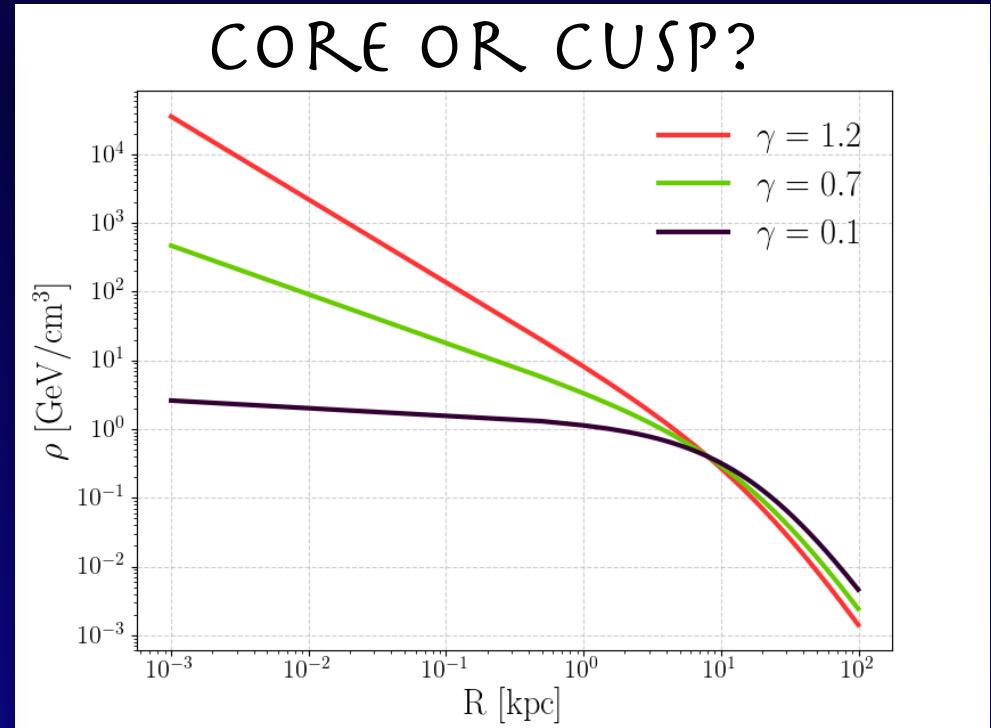
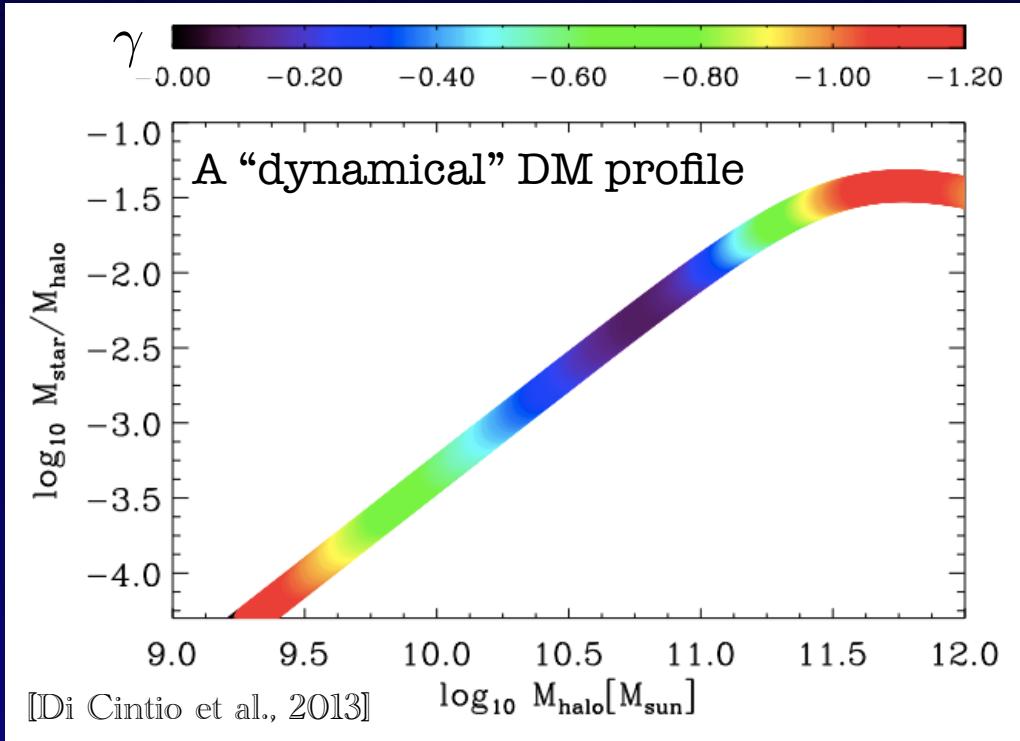


NAVARRO-FRENK-WHITE

$$\rho(R) \propto \frac{R_s}{R} \left(1 + \frac{R}{R_s}\right)^{-2}$$

A story of Λ CDM

chapter IV: the dark matter distribution



generalized NFW

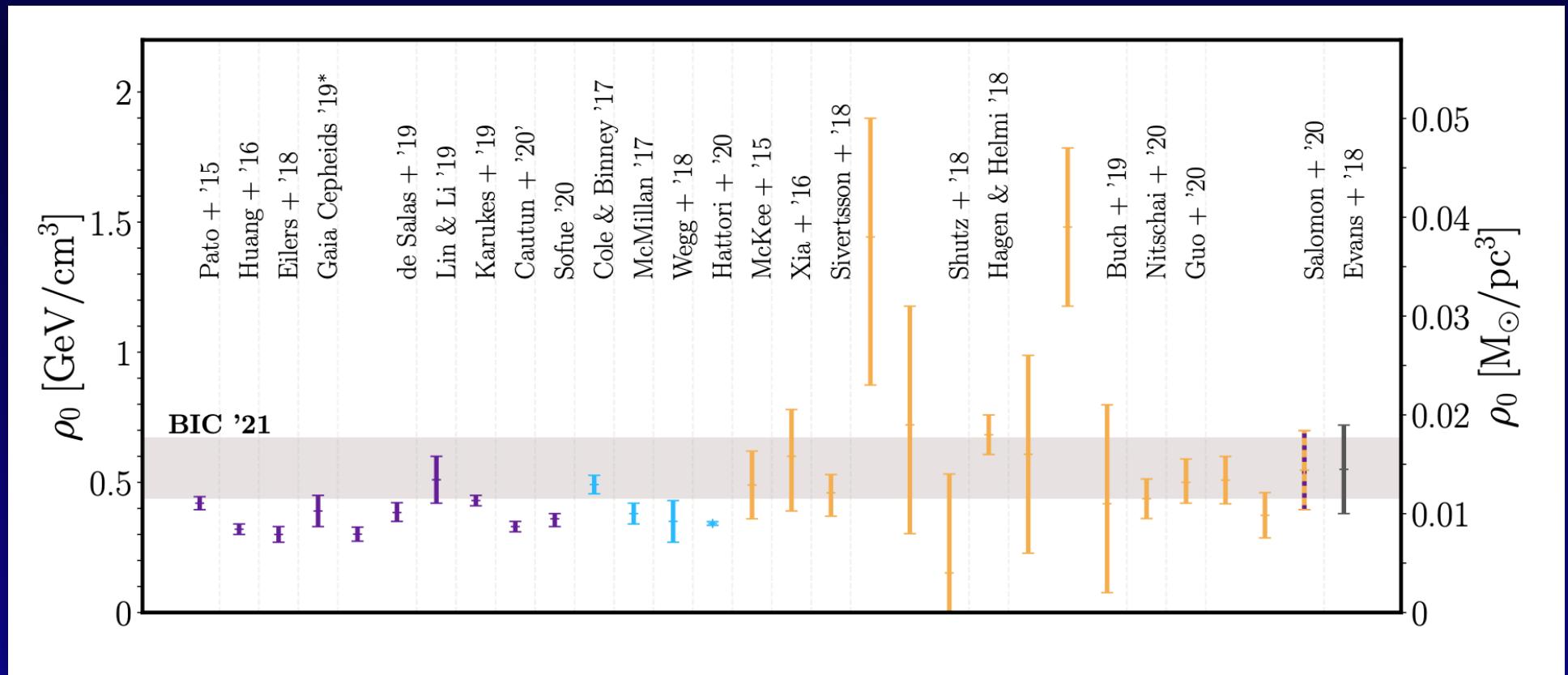
$$\rho_{DM}(R) \propto \rho_0 \left(\frac{R}{R_s} \right)^{-\gamma} \left(1 + \frac{R}{R_s} \right)^{-3+\gamma}$$

What is the actual distribution of DM in the Milky Way?



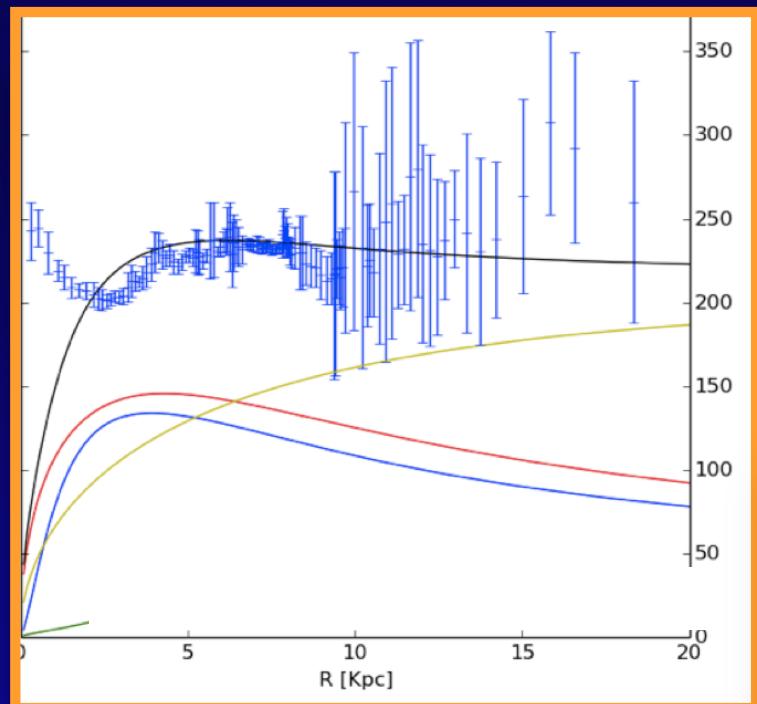
And if you care about the proximity of the Sun?

Empirical determination of local DM density: recent determinations



The DM distribution in disk galaxies: the Rotation Curve method

Fitting a pre-assigned shape
on top of luminous

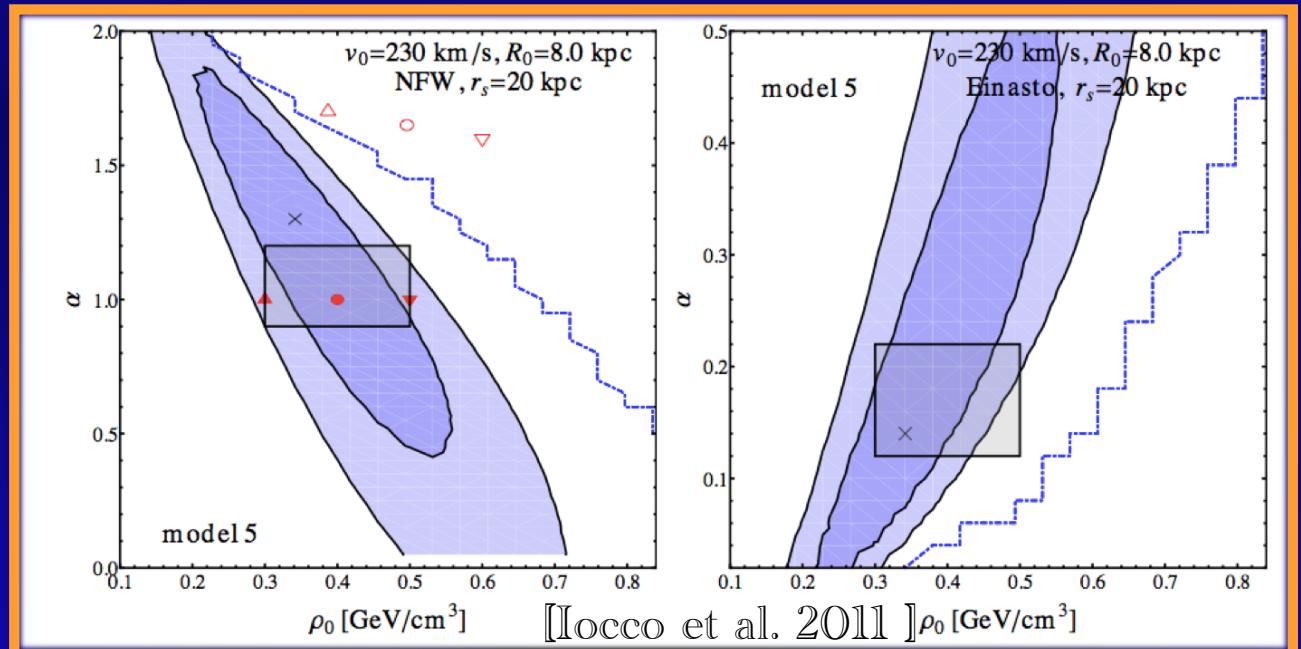


gNFW

$$\rho_{DM}(R) \propto \rho_0 \left(\frac{R}{R_s} \right)^{-\gamma} \left(1 + \frac{R}{R_s} \right)^{-3+\gamma}$$

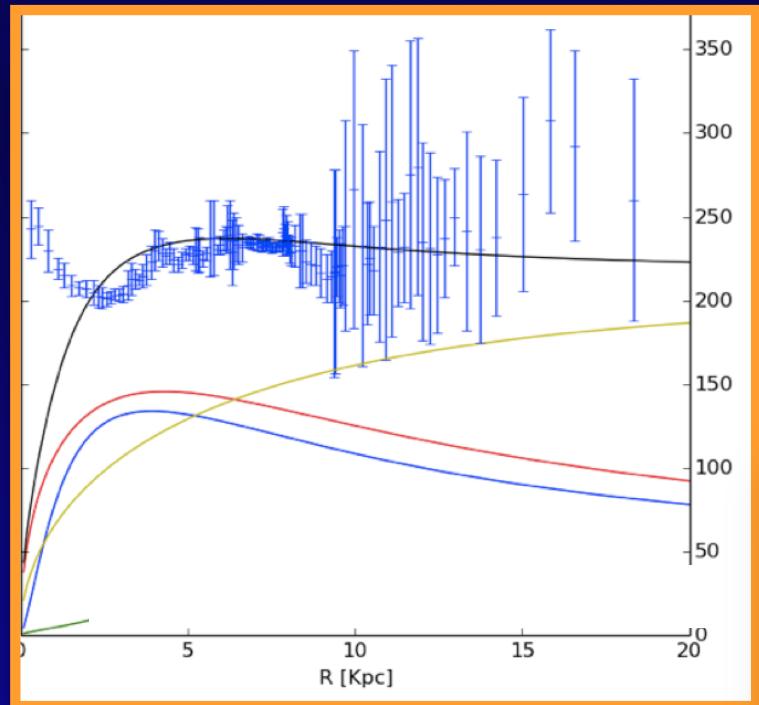
Einasto

$$\rho_{DM}(R) \propto \rho_0 \exp \left[-\frac{2}{\gamma} \left(\left(\frac{R}{R_s} \right)^\gamma - 1 \right) \right]$$

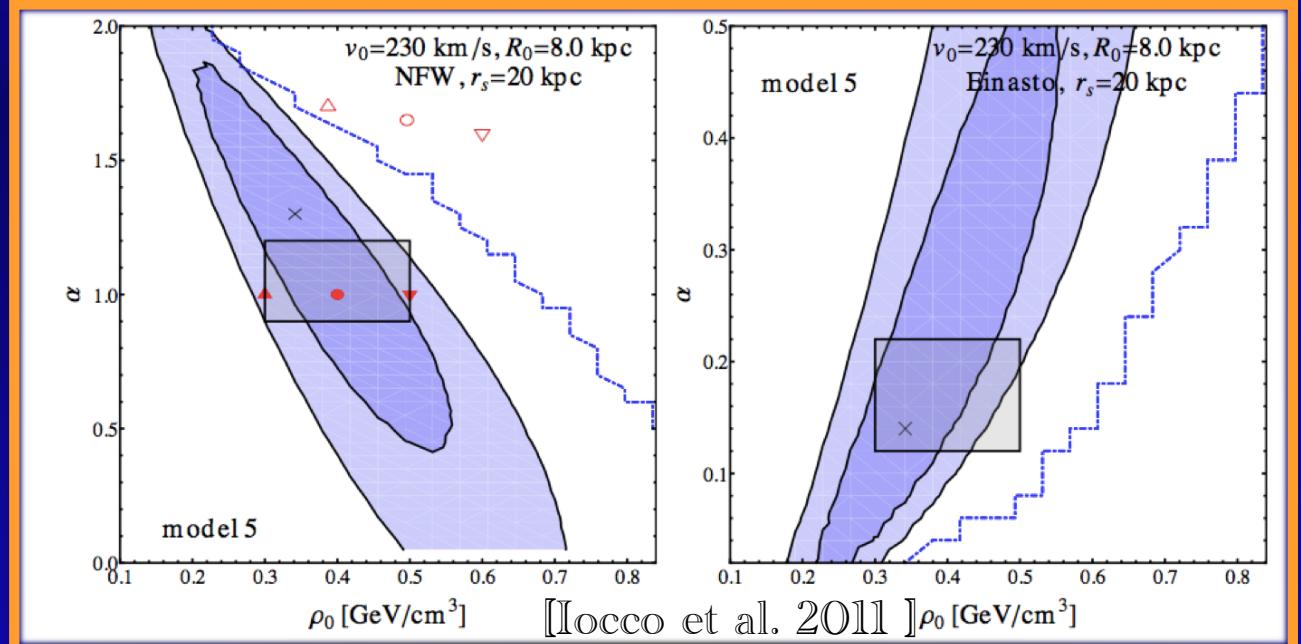


[many authors, e.g.
Iocco et al. 2011]

The Rotation Curve method requires a lot of (fortunate) conditions

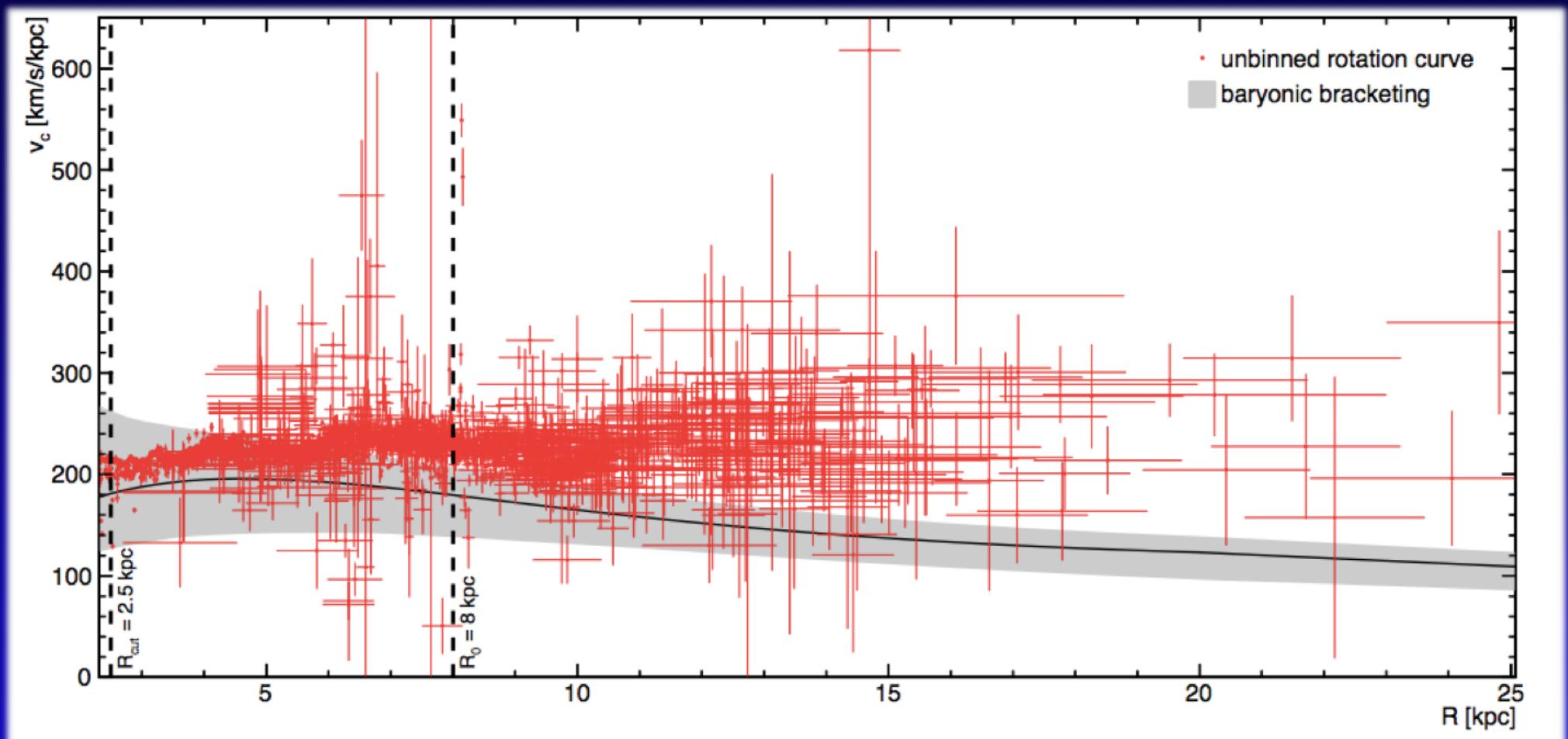


The Anna Karenina principle:
“all happy families are alike”



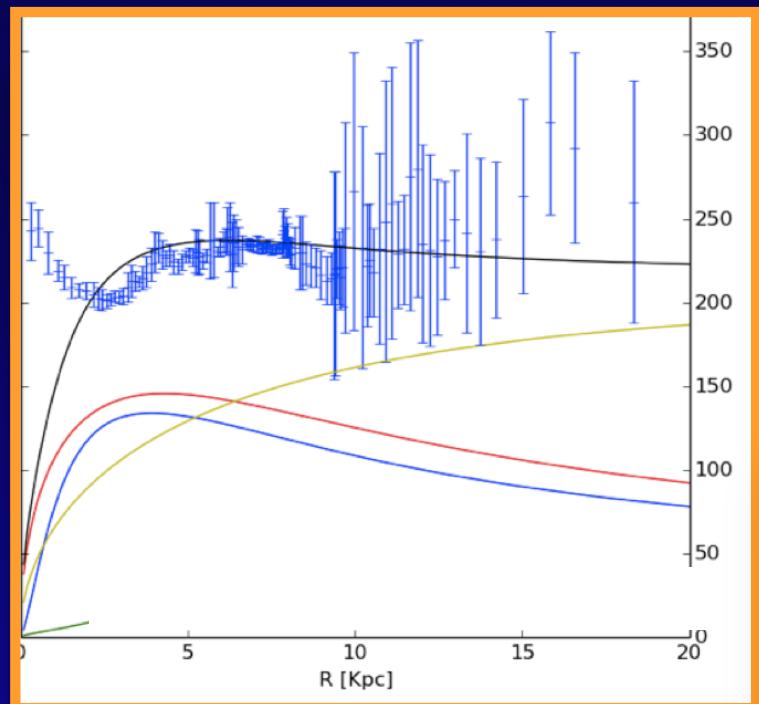
[many authors, e.g.
Iocco et al. 2011]

The Milky Way rotation curve



The DM distribution in disk galaxies: the Rotation Curve method

Fitting a pre-assigned shape
on top of luminous

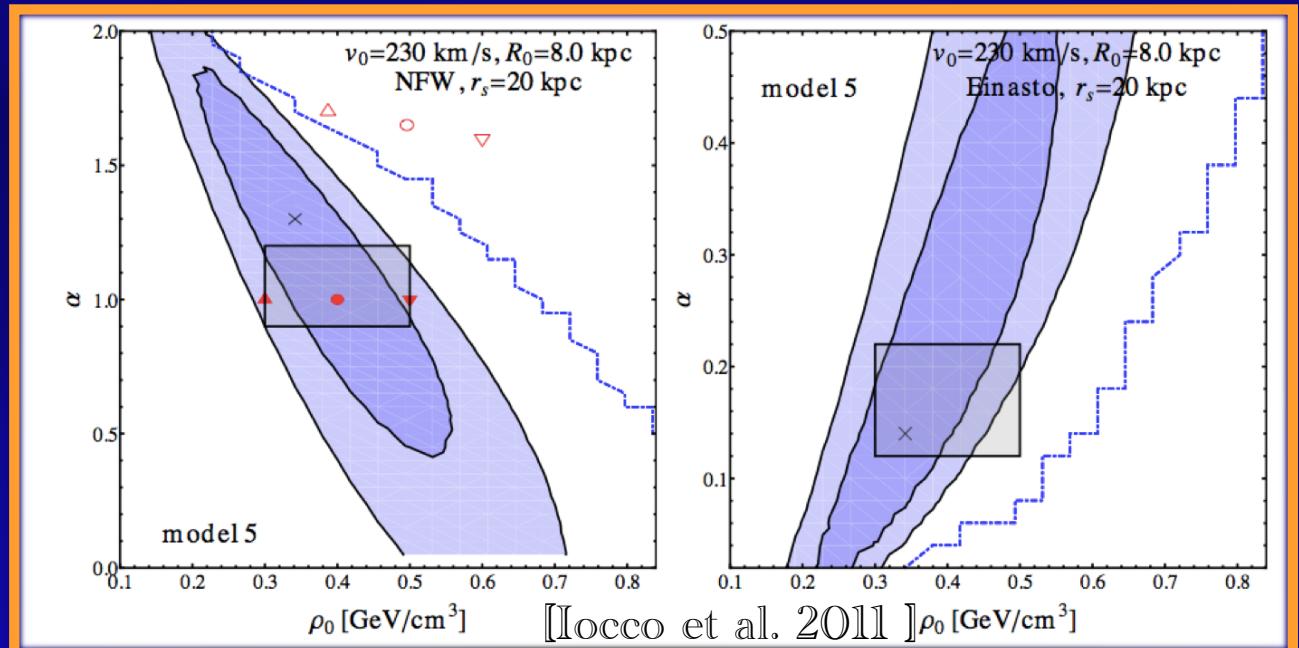


gNFW

$$\rho_{DM}(R) \propto \rho_0 \left(\frac{R}{R_s} \right)^{-\gamma} \left(1 + \frac{R}{R_s} \right)^{-3+\gamma}$$

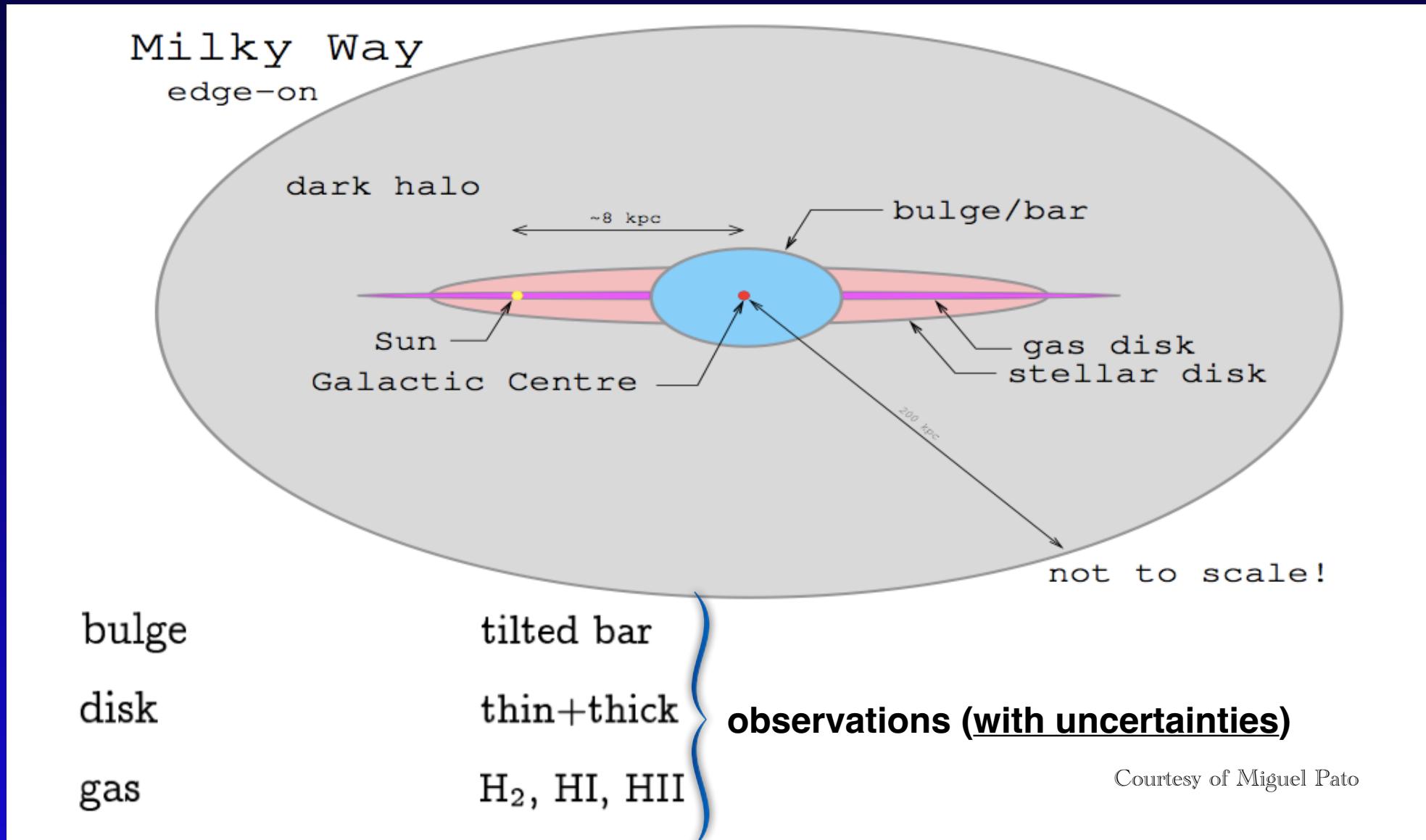
Einasto

$$\rho_{DM}(R) \propto \rho_0 \exp \left[-\frac{2}{\gamma} \left(\left(\frac{R}{R_s} \right)^\gamma - 1 \right) \right]$$



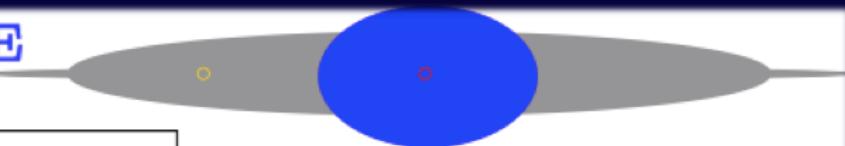
[many authors, e.g.
Iocco et al. 2011]

The Rotation Curve method, an example: the Milky Way



The luminous Milky Way: observations of morphology

2. BARYONS: STELLAR BULGE



$$\rho_{\text{bulge}} = \rho_0 f(x, y, z)$$

morphology $f(x, y, z)$

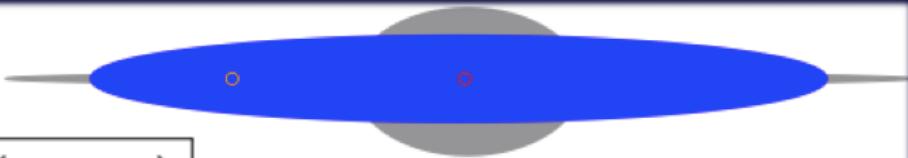
Stanek+ '97 (E2)	e^{-r}	0.9:0.4:0.3	24°	optical
Stanek+ '97 (G2)	$e^{-r_s^2/2}$	1.2:0.6:0.4	25°	optical
Zhao '96	$e^{-r_s^2/2} + r_a^{-1.85} e^{-r_a}$	1.5:0.6:0.4	20°	infrared
Bissantz & Gerhard '02	$e^{-r_s^2}/(1+r)^{1.8}$	2.8:0.9:1.1	20°	infrared
Lopez-Corredoira+ '07	Ferrer potential	7.8:1.2:0.2	43°	infrared/optical
Vanhollebeke+ '09	$e^{-r_s^2}/(1+r)^{1.8}$	2.6:1.8:0.8	15°	infrared/optical
Robin+ '12	$\operatorname{sech}^2(-r_s) + e^{-r_s}$	1.5:0.5:0.4	13°	infrared

normalisation ρ_0 and its statistical uncertainties

microlensing optical depth: $\langle \tau \rangle = 2.17^{+0.47}_{-0.38} \times 10^{-6}$, $(\ell, b) = (1.50^\circ, -2.68^\circ)$
(MACHO '05)

The luminous Milky Way: observations of morphology

2. BARYONS: STELLAR DISK



$$\rho_{\text{disk}} = \rho_0 f(x, y, z)$$

morphology $f(x, y, z)$

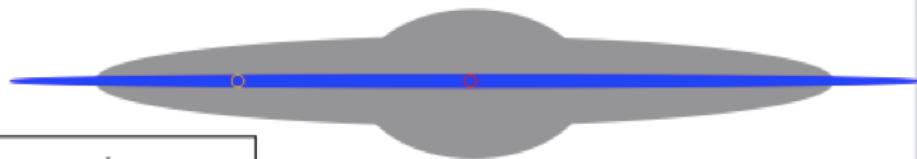
Han & Gould '03	$e^{-R} \operatorname{sech}^2(z)$ $e^{-R- z }$	2.8:0.27 2.8:0.44	thin thick	optical
Calchi-Novati & Mancini '11	$e^{-R- z }$ $e^{-R- z }$	2.8:0.25 4.1:0.75	thin thick	optical
deJong+ '10	$e^{-R- z }$ $e^{-R- z }$ $(R^2 + z^2)^{-2.75/2}$	2.8:0.25 4.1:0.75 1.0:0.88	thin thick halo	optical
Jurić+ '08	$e^{-R- z }$ $e^{-R- z }$ $(R^2 + z^2)^{-2.77/2}$	2.2:0.25 3.3:0.74 1.0:0.64	thin thick halo	optical
Bovy & Rix '13	$e^{-R- z }$	2.2:0.40	single	optical

normalization and its statistical uncertainties

local surface density: $\Sigma_* = 38 \pm 4 \text{M}_\odot/\text{pc}^2$ [Bovy & Rix '13]

The luminous Milky Way: observations of morphology

2. BARYONS: GAS



$$n_{\text{H}} = 2n_{\text{H}_2} + n_{\text{HI}} + n_{\text{HII}}$$

morphology

Ferrière '12	$r < 0.01 \text{ kpc}$	$M_{\text{gas}} \sim 7 \times 10^5 \text{ M}_{\odot}$			CO, 21cm, H α , ...
Ferrière+ '07	$r = 0.01 - 2 \text{ kpc}$	CMZ, holed disk CMZ, holed disk warm, hot, very hot	H ₂ H I H II	CO 21cm disp. meas.	
Ferrière '98	$r = 3 - 20 \text{ kpc}$	molecular ring cold, warm warm, hot	H ₂ H I H II	CO 21cm disp. meas., H α	
Moskalenko+ '02	$r = 3 - 20 \text{ kpc}$	molecular ring	H ₂ H I H II	CO 21cm disp. meas.	

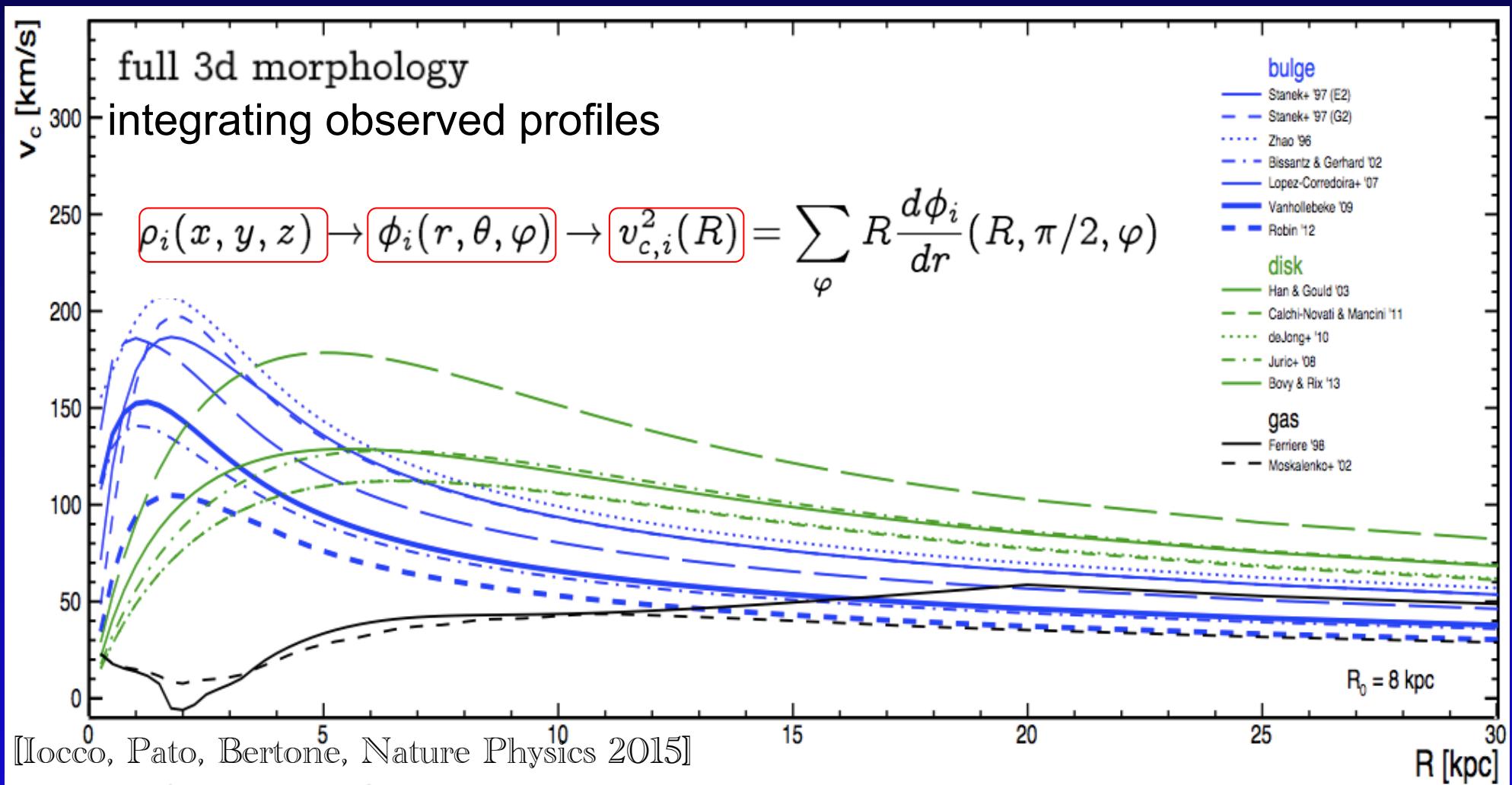
uncertainties

CO-to-H₂ factor: $X_{\text{CO}} = 0.25 - 1.0 \times 10^{20} \text{ cm}^{-2} \text{ K}^{-1} \text{ km}^{-1} \text{ s}$ for $r < 2 \text{ kpc}$
 $X_{\text{CO}} = 0.50 - 3.0 \times 10^{20} \text{ cm}^{-2} \text{ K}^{-1} \text{ km}^{-1} \text{ s}$ for $r > 2 \text{ kpc}$

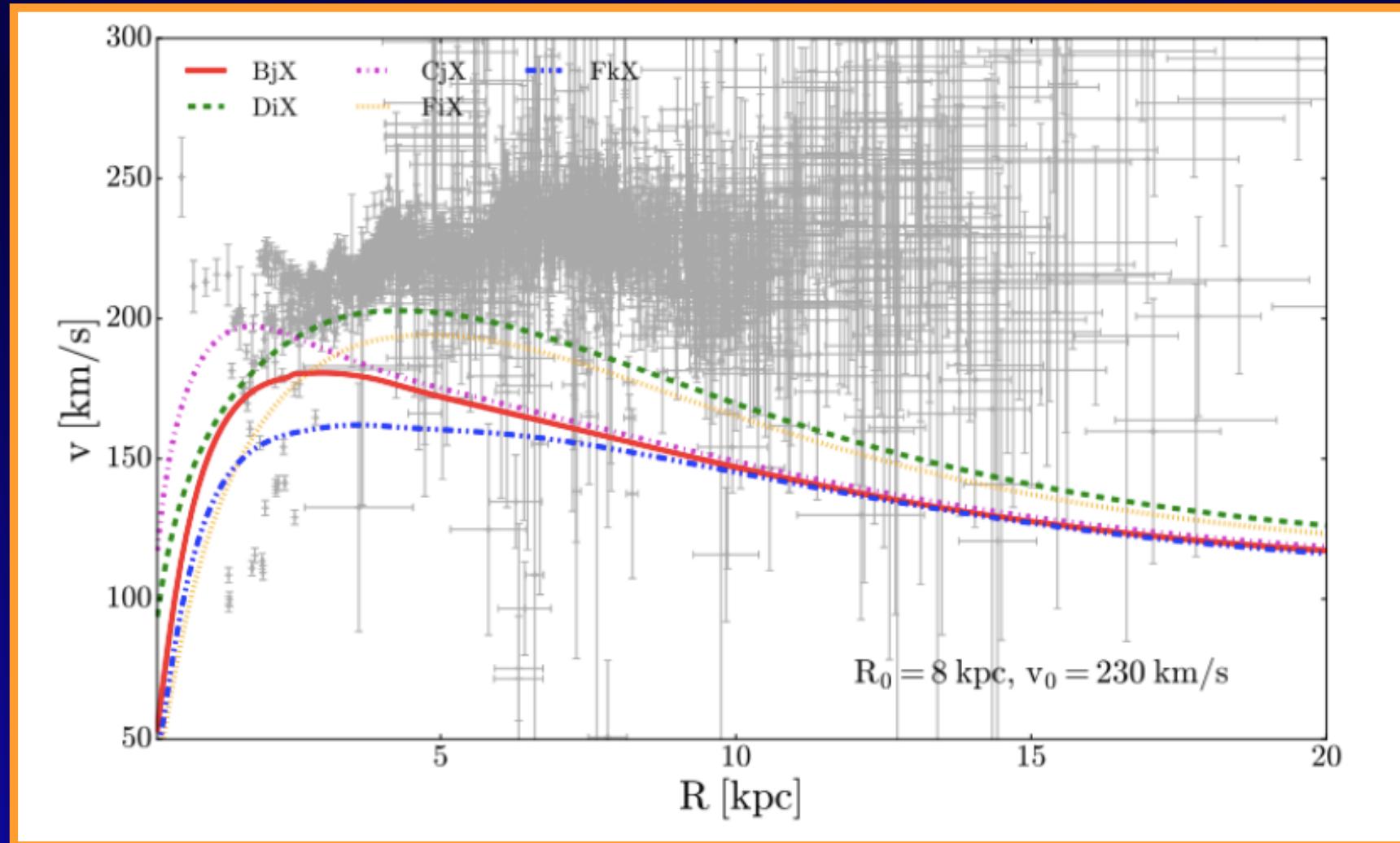
[Ferrière+ '07, Ackermann '12]

The luminous Milky Way: expected rotation curve

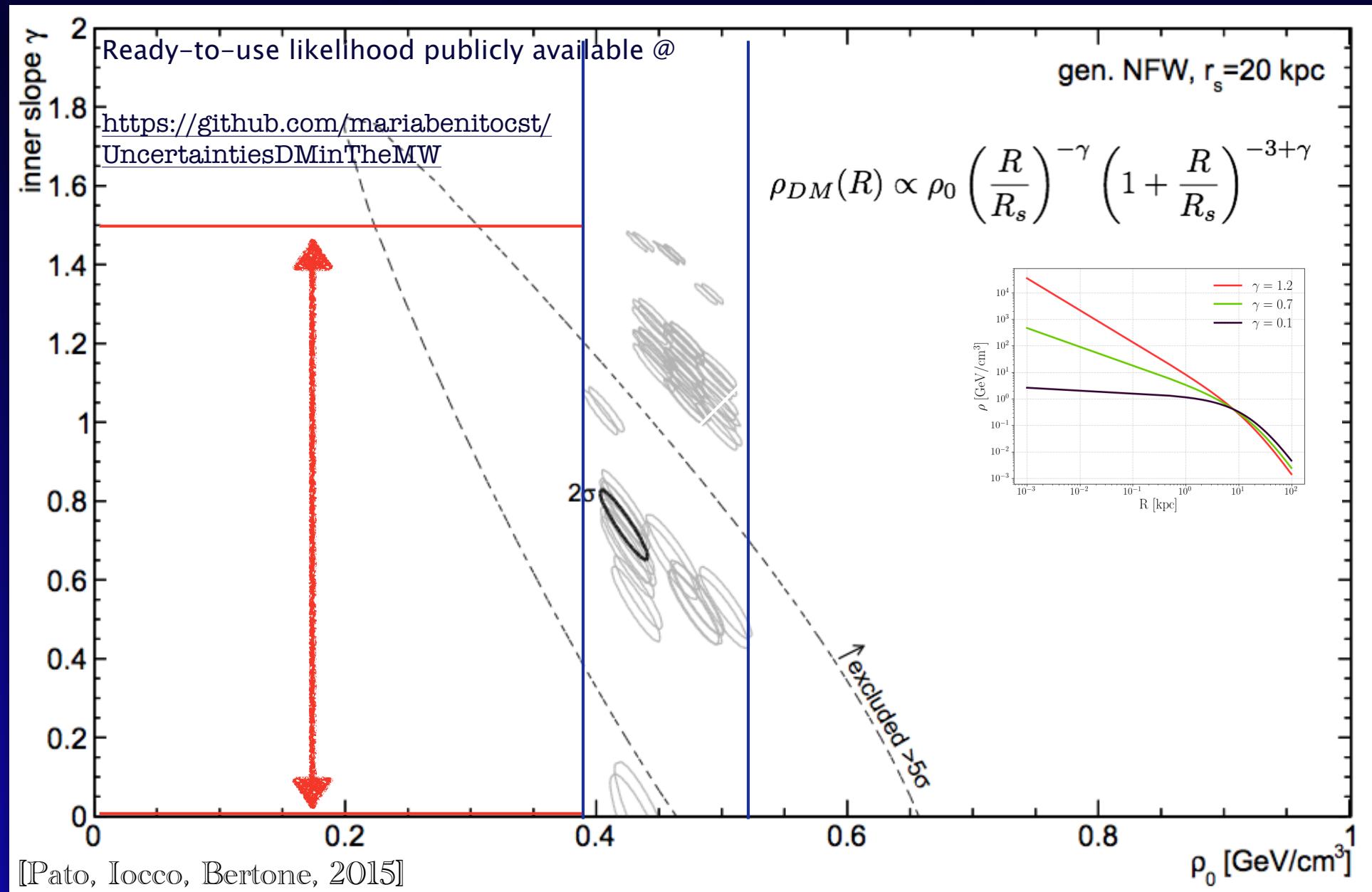
$$\phi_i(r, \theta, \varphi) = -4\pi G \sum_{l,m} \frac{Y_{lm}(\theta, \varphi)}{2l+1} \left[\frac{1}{r^{l+1}} \int_0^r \rho_{i,lm}(a) a^{l+2} da + r^l \int_r^\infty \rho_{i,lm}(a) a^{1-l} da \right]$$



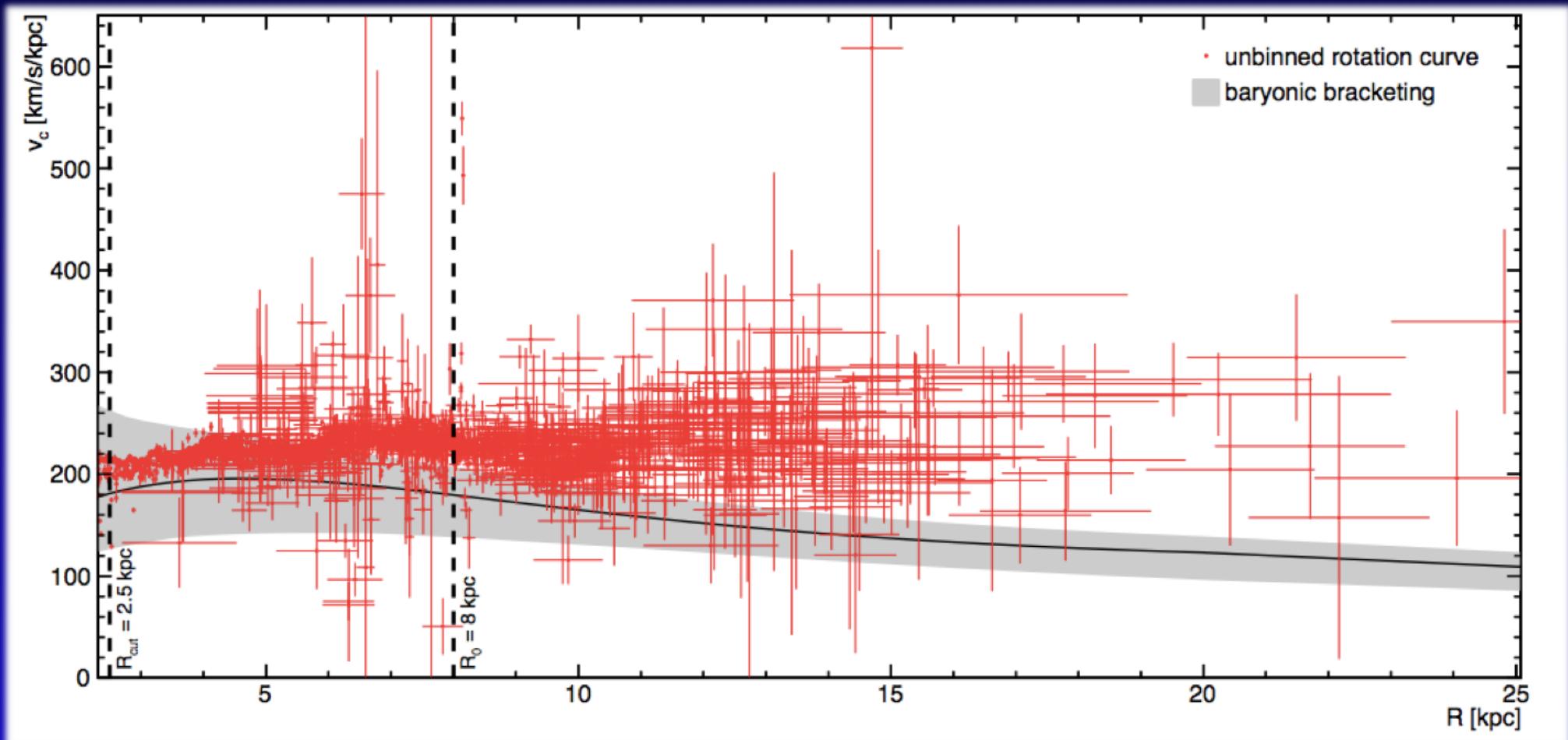
Systematic uncertainties (luminous component)



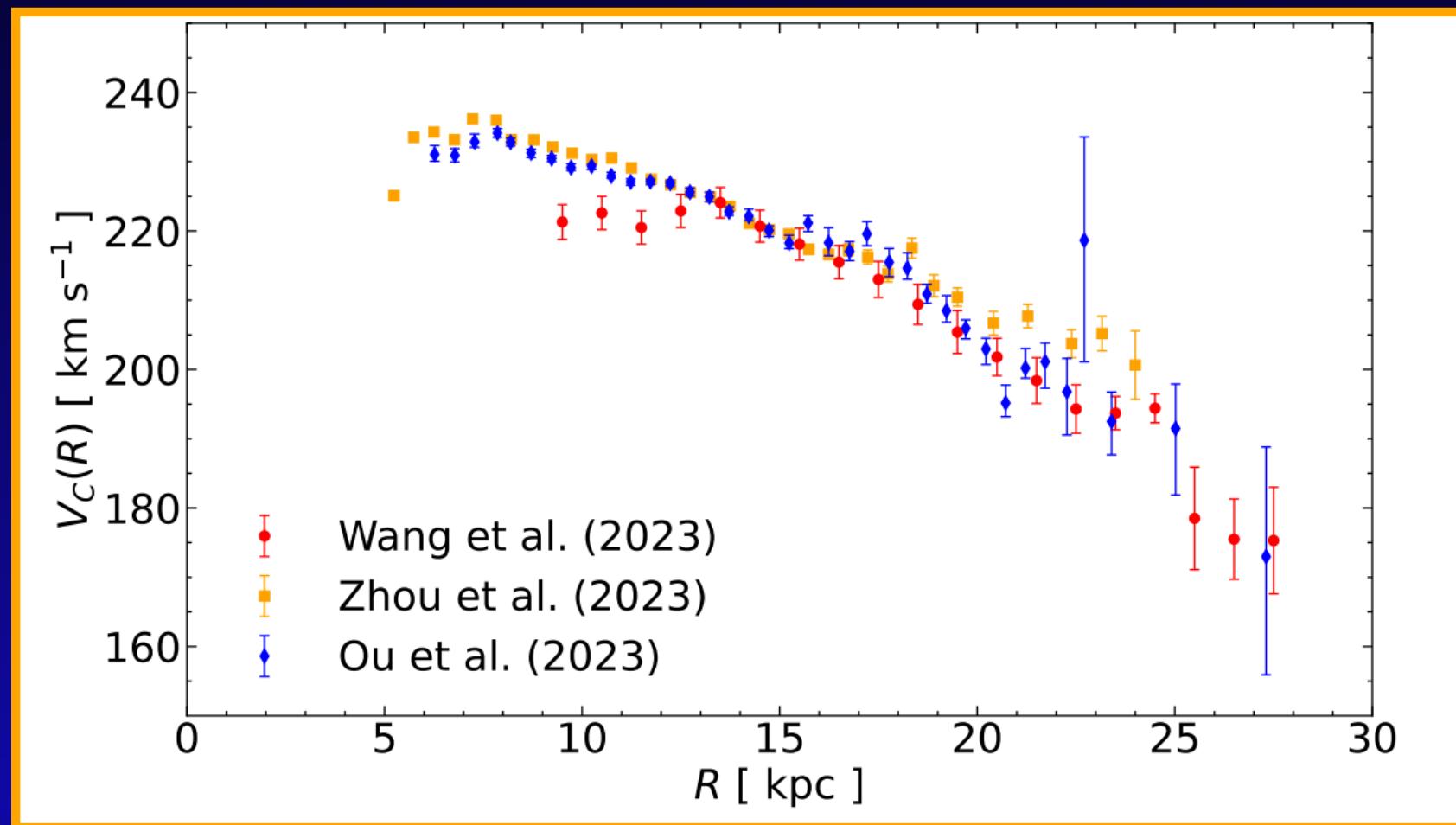
Extracting the DM density structure



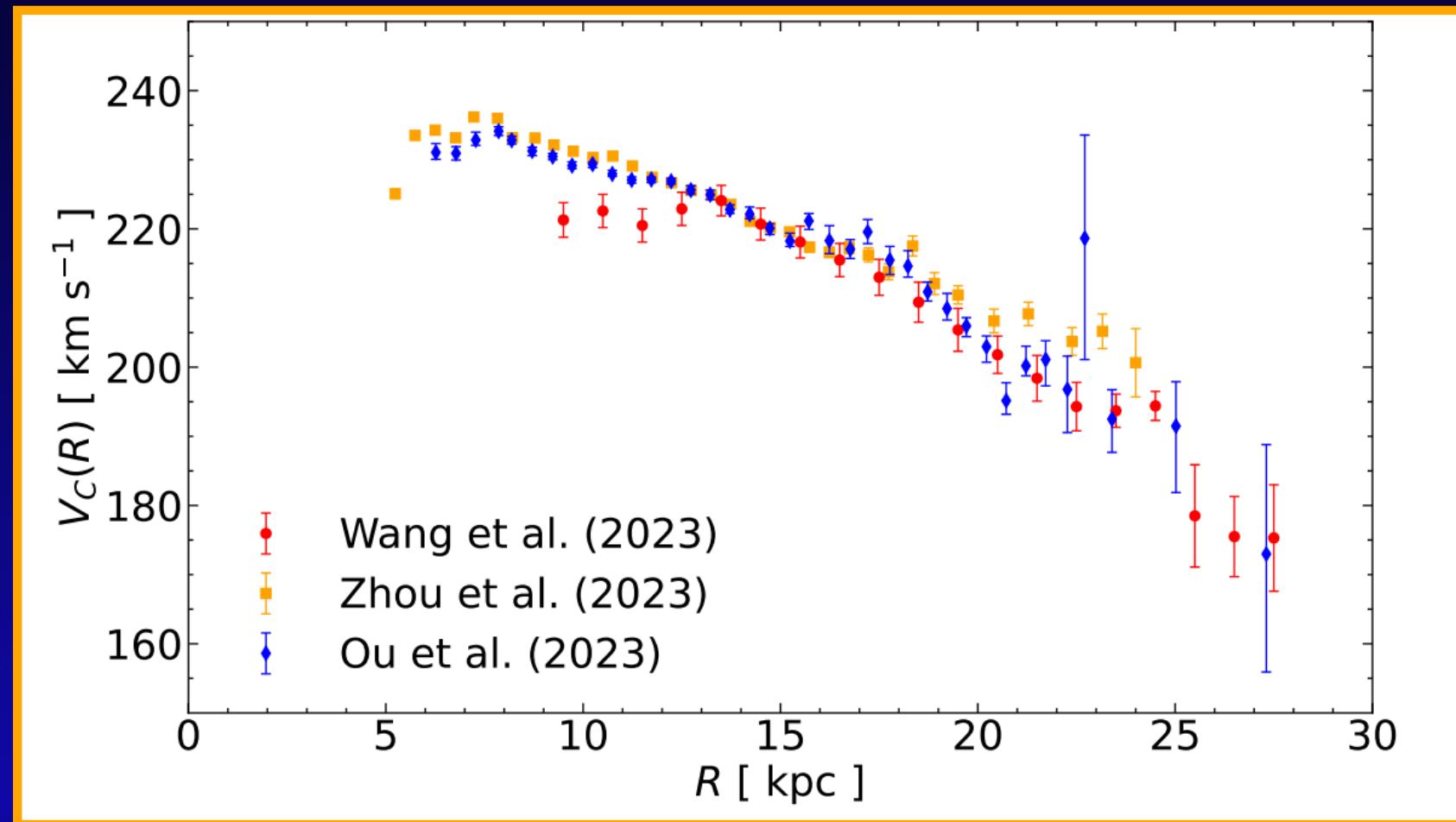
The Rotation Curve method, an example: the Milky Way



Recently, enters Gaia (data):



Recently, enters Gaia (data):

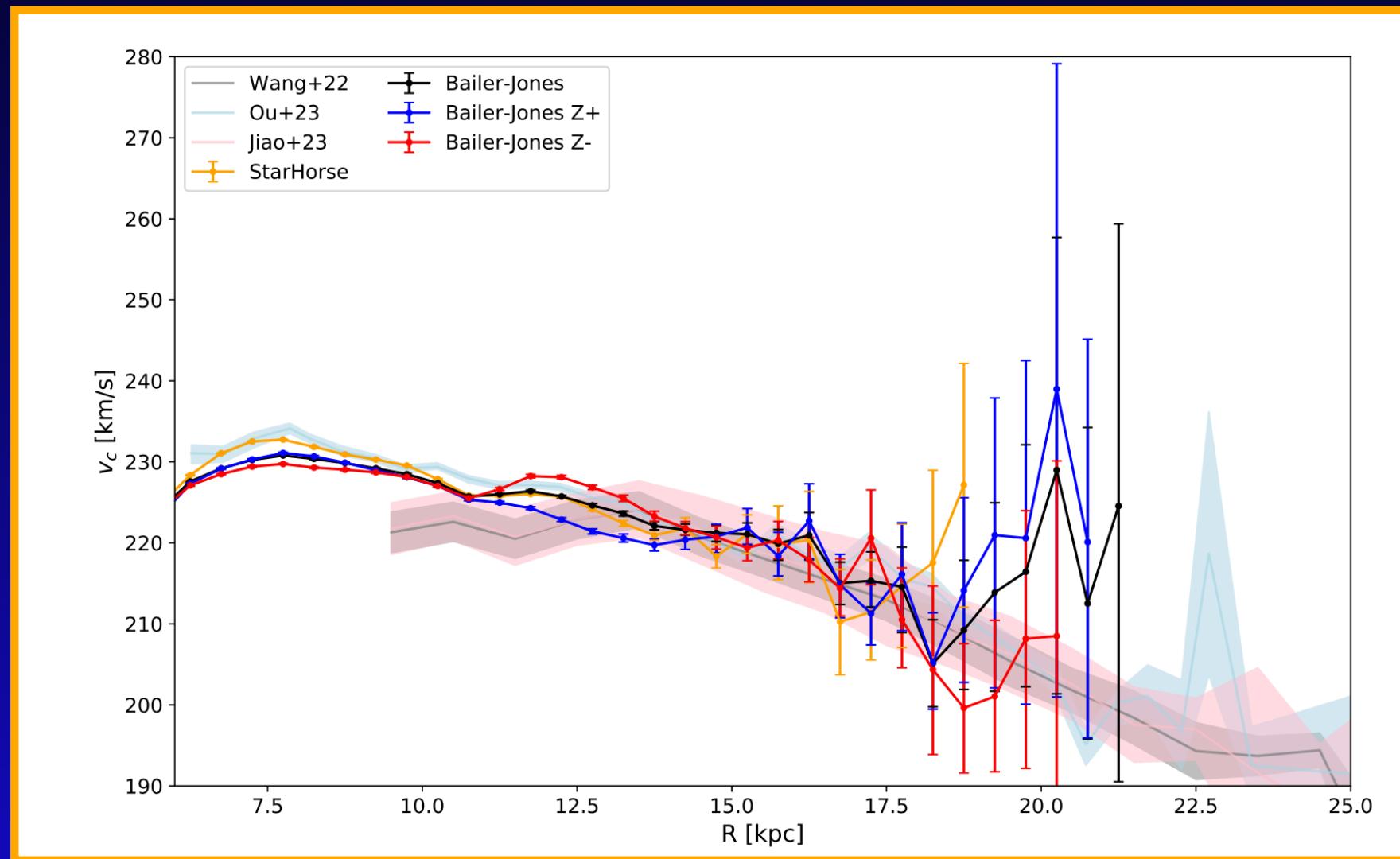


The devil is in the details
(read the small print)

$$\frac{\partial(\nu \langle v_R^2 \rangle)}{\partial R} + \frac{\partial(\nu \langle v_R v_z \rangle)}{\partial z} + \nu \left(\frac{\langle v_R^2 \rangle - \langle v_\phi^2 \rangle}{R} + \frac{\partial \Phi}{\partial R} \right)$$

$$\langle v_R^2 \rangle(R) \propto \exp\left(\frac{-R}{R_{\text{exp}, \langle v_R^2 \rangle}}\right)$$

Recently, enters Gaia (data):



Worrisome enough: history apparently repeats itself *(to DM or not to DM?)*

Kinematical and chemical vertical structure of the Galactic thick disk^{1,2}
II. A lack of dark matter in the solar neighborhood

C. Moni Bidin

On the local dark matter density

Jo Bovy¹ and Scott Tremaine

[2012]

Institute for Advanced Study, Einstein Drive, Princeton, NJ 08540, USA

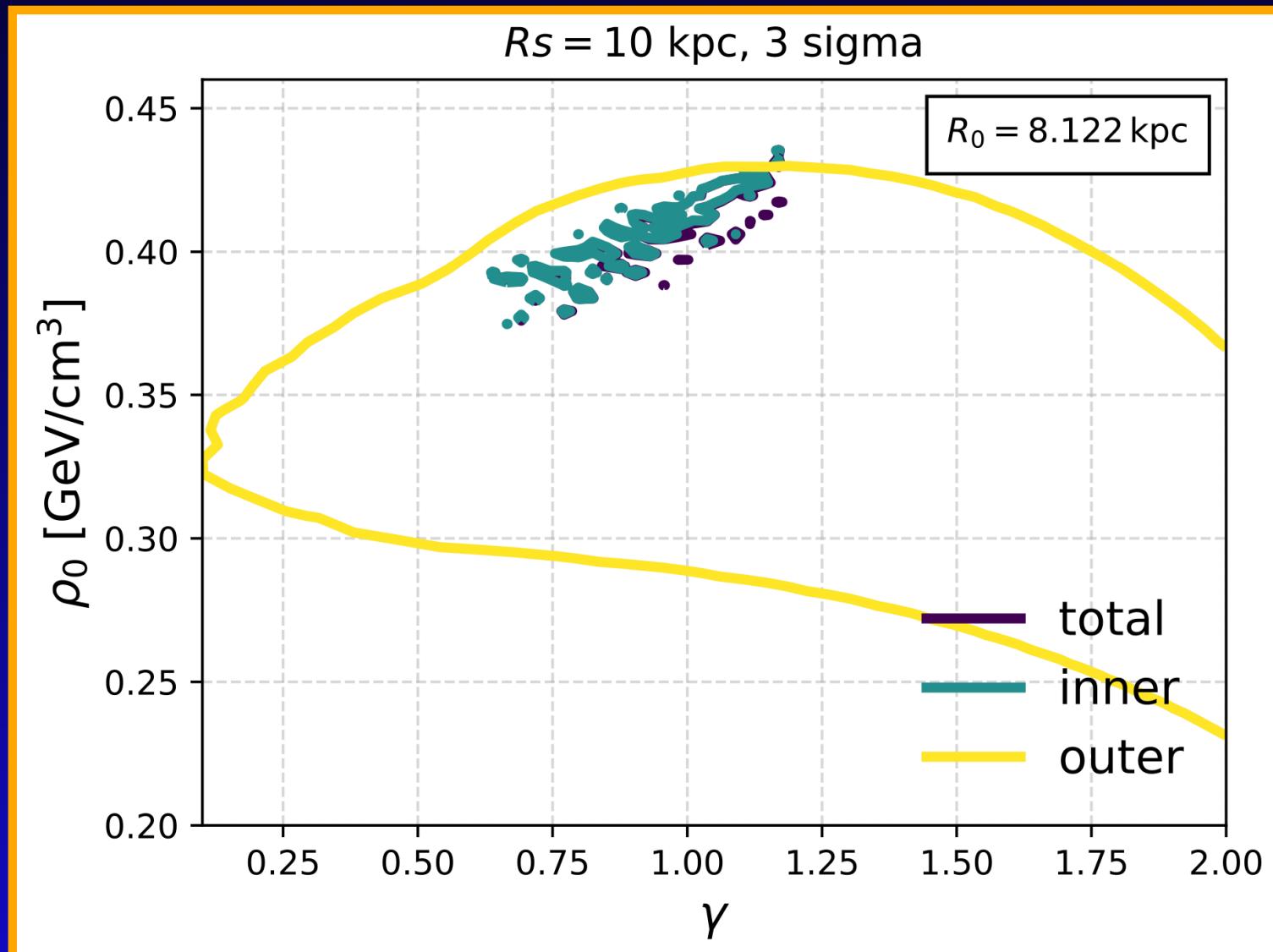
$$F_R(R, Z) = -\frac{\partial \Phi(R, Z)}{\partial R} = \frac{1}{\nu} \frac{\partial (\nu \sigma_U^2)}{\partial R} + \frac{1}{\nu} \frac{\partial (\nu \sigma_{UW}^2)}{\partial Z} + \frac{\sigma_U^2 - \sigma_V^2 - \bar{V}^2}{R}$$

Evidence for dark matter in the inner Milky Way

Fabio Iocco^{1,2}, Miguel Pato^{3,4} & Gianfranco Bertone⁵

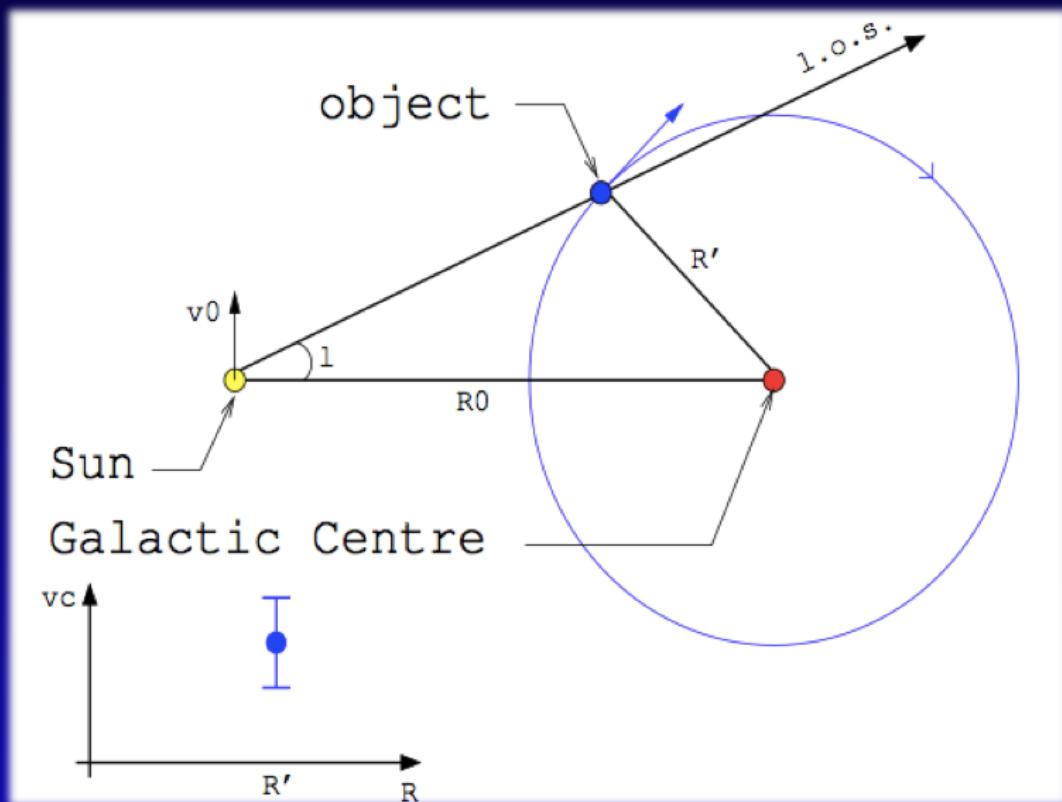
[2015]

Comforting enough: no dramatic effect on DM distribution



The Milky Way: observed rotation curve

Neglecting some quite remarkable uncertainties (for now)



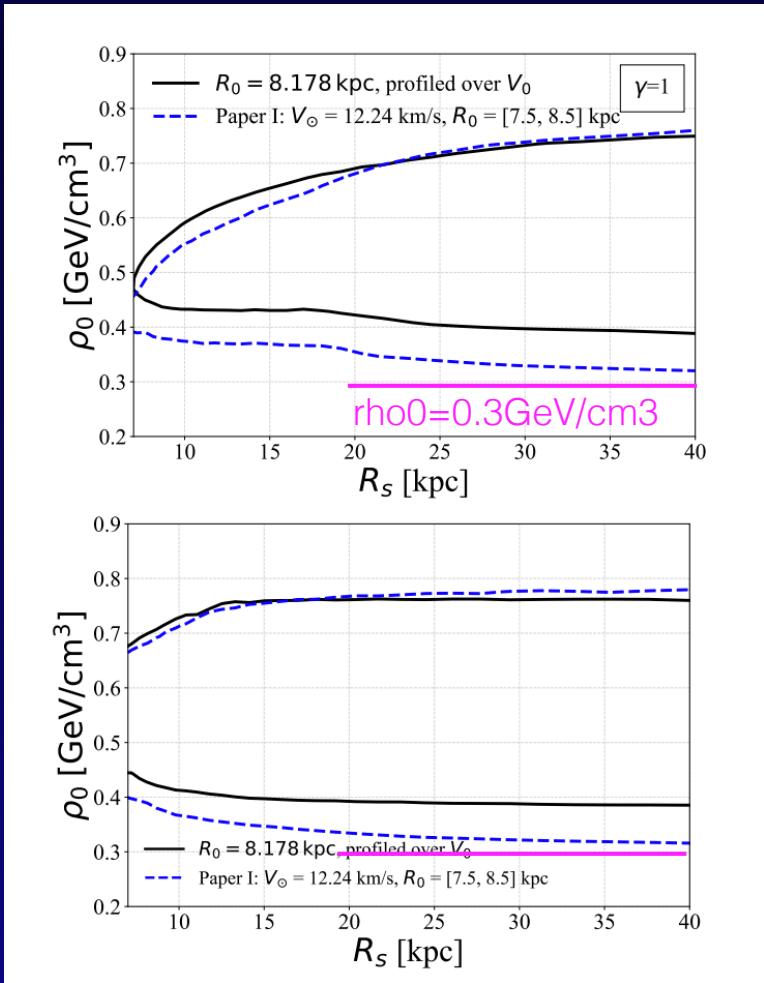
$$v_{\text{L.S.R.}}^{\text{l.o.s.}} = \left(\frac{v_c(R')}{R'/R_0} - v_0 \right) \cos b \sin \ell$$

observing tracers from our own position,
transforming into GC-centric reference frame

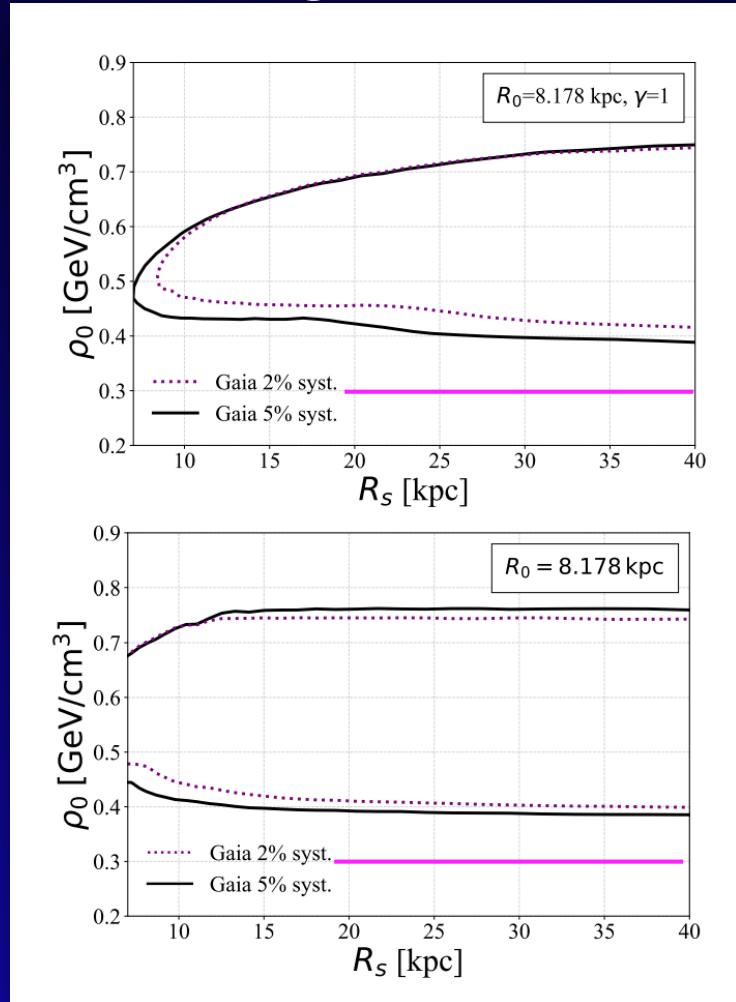
Uncertainties on (R_0, v_0)
ultimately affects our
determination of
(ρ_0 , γ)

Profiling over Galactic uncertainties

Testing approaches



Testing datasets

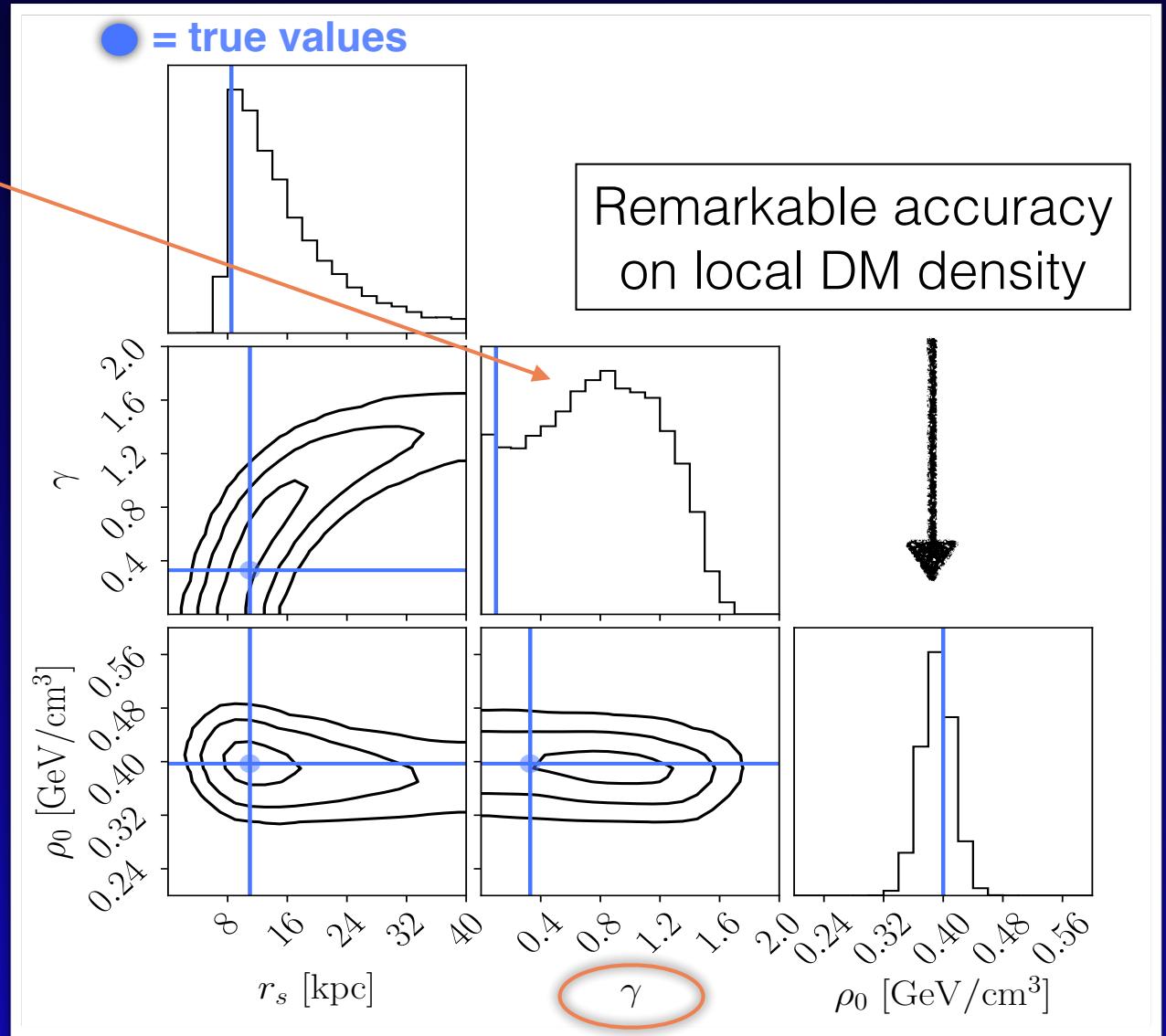
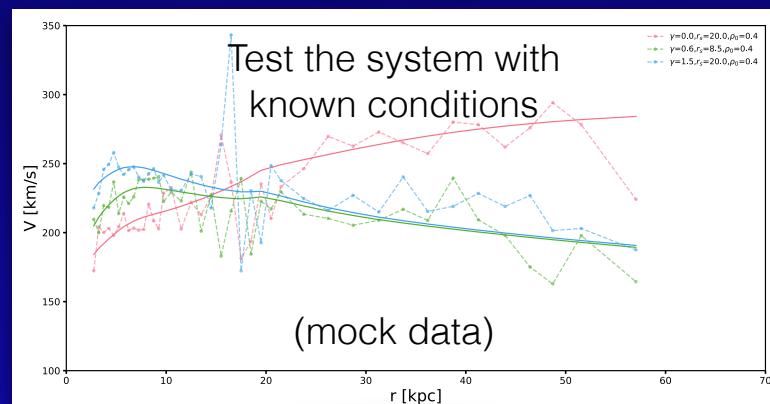


Please use the full likelihood:
publicly available!!

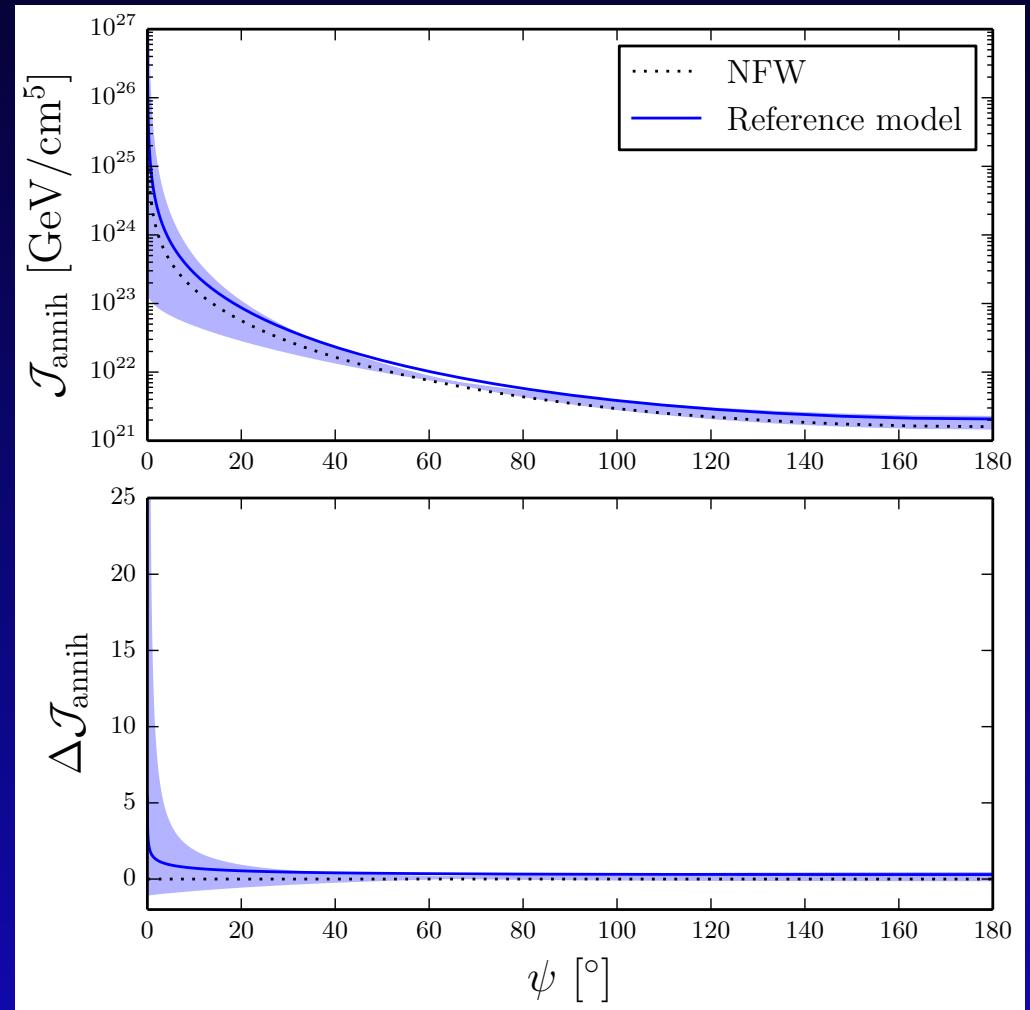
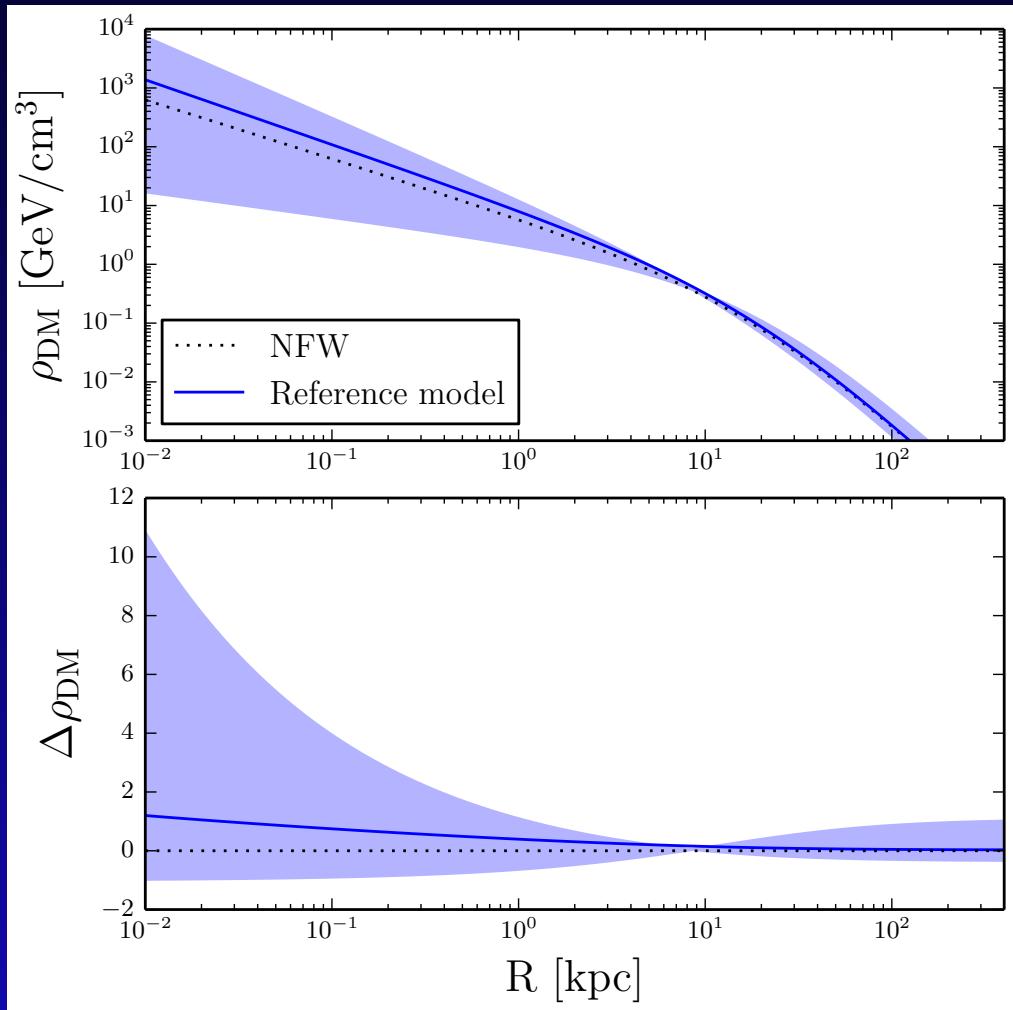
<https://github.com/mariabenitocst/UncertaintiesDMinTheMW>
[Benito, Iocco, Cuoco, PDU 2021, arXiv:2009.13523]

What to do of our measurement?

(Our instrument is very precise. Is it accurate?)

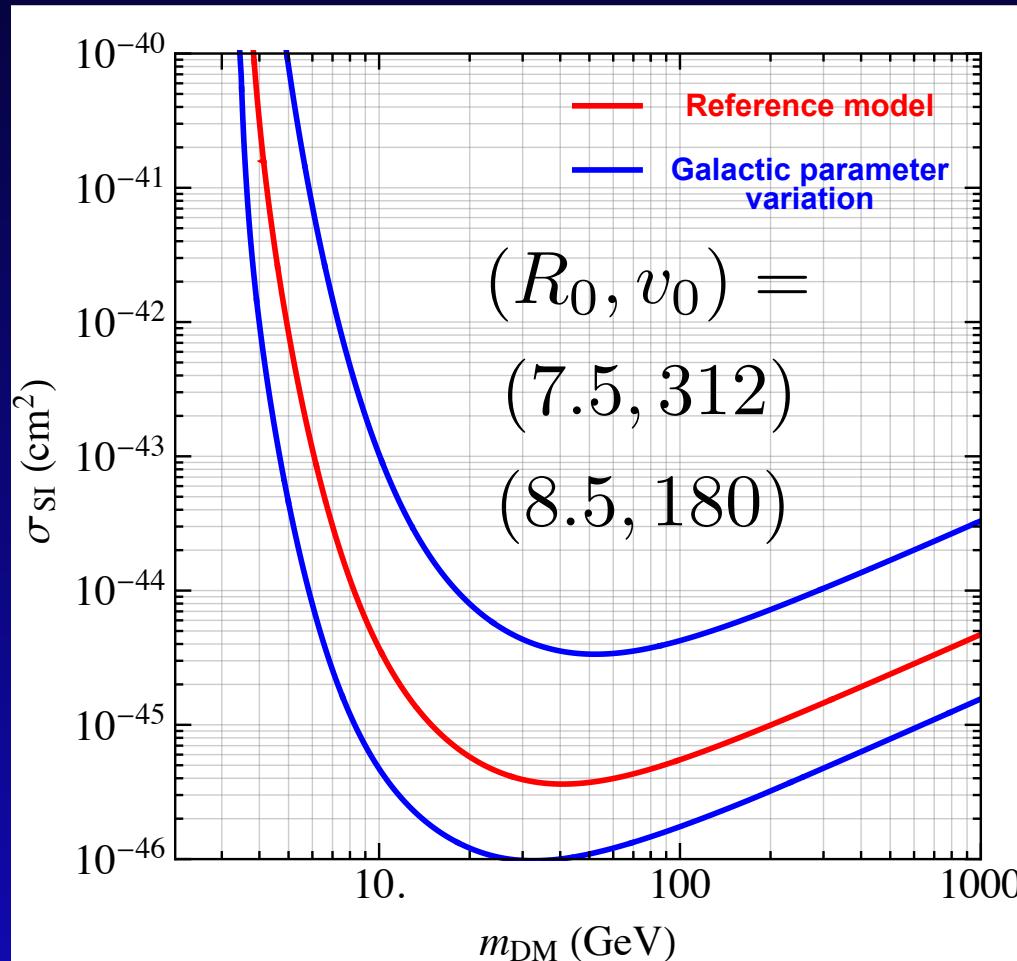


But do Galactic uncertainties affect PP, for real?



$$J_{\text{annih}} \propto \int_{\text{los}} \rho^2(r) dV$$

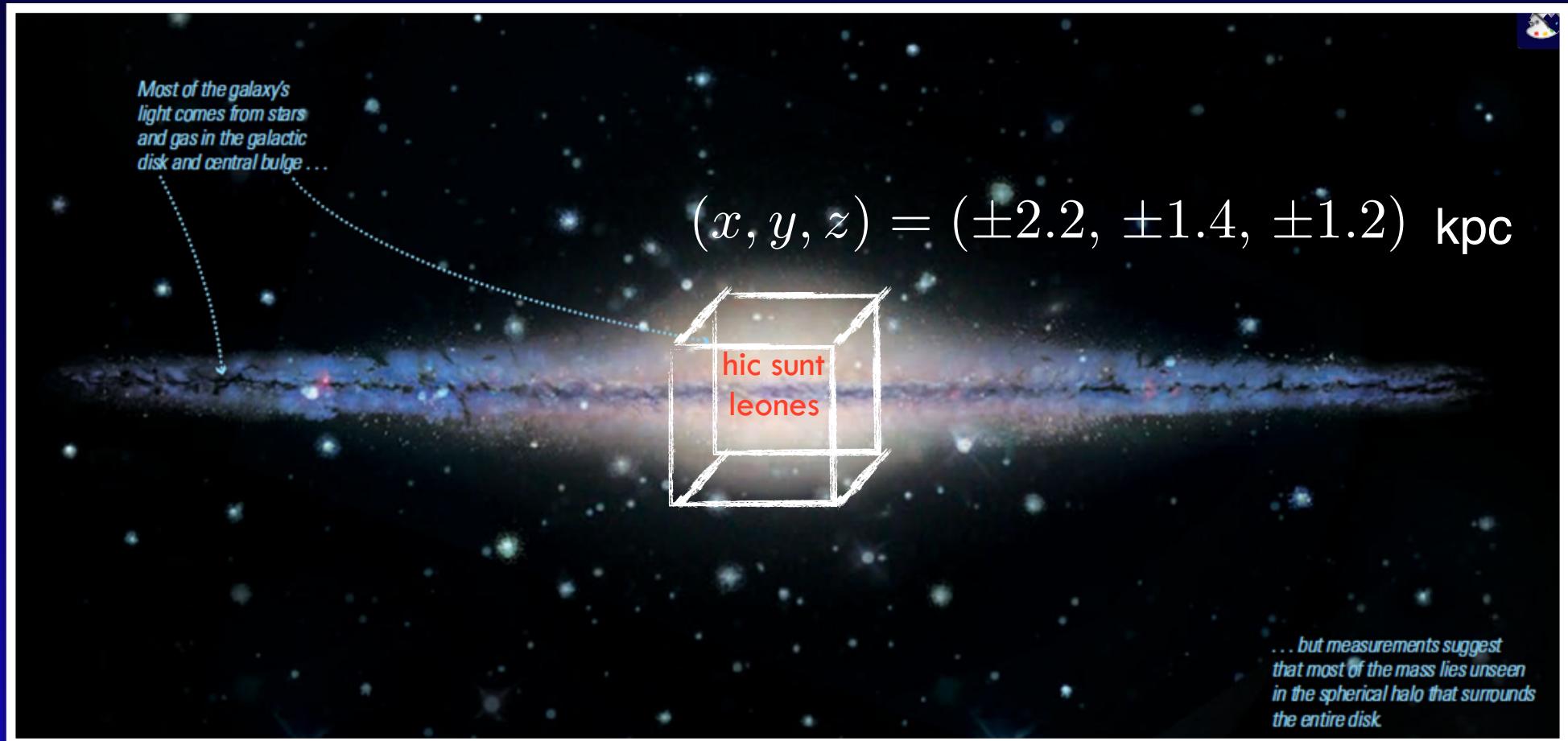
It is well known that uncertainties affect Direct Detection



2015 LUX limits, varying astrophysical uncertainties

[Benito, Bernàl, Bozorgnia, Calore, Iocco, JCAP 2017, arXiv:1612.02010]

Galactic Center: a beast of its own



Total mass

$$M_{total} = (1.85 \pm 0.05) \times 10^{10} M_{\odot}$$

Portail +
MNRAS 465 (2017)

Stellar mass

$$M_*^i = \int_{box} \rho_*^i(x, y, z) dV$$

[Iocco & Benito] PDU 15 (2017)

Methodology: Allowed DM mass

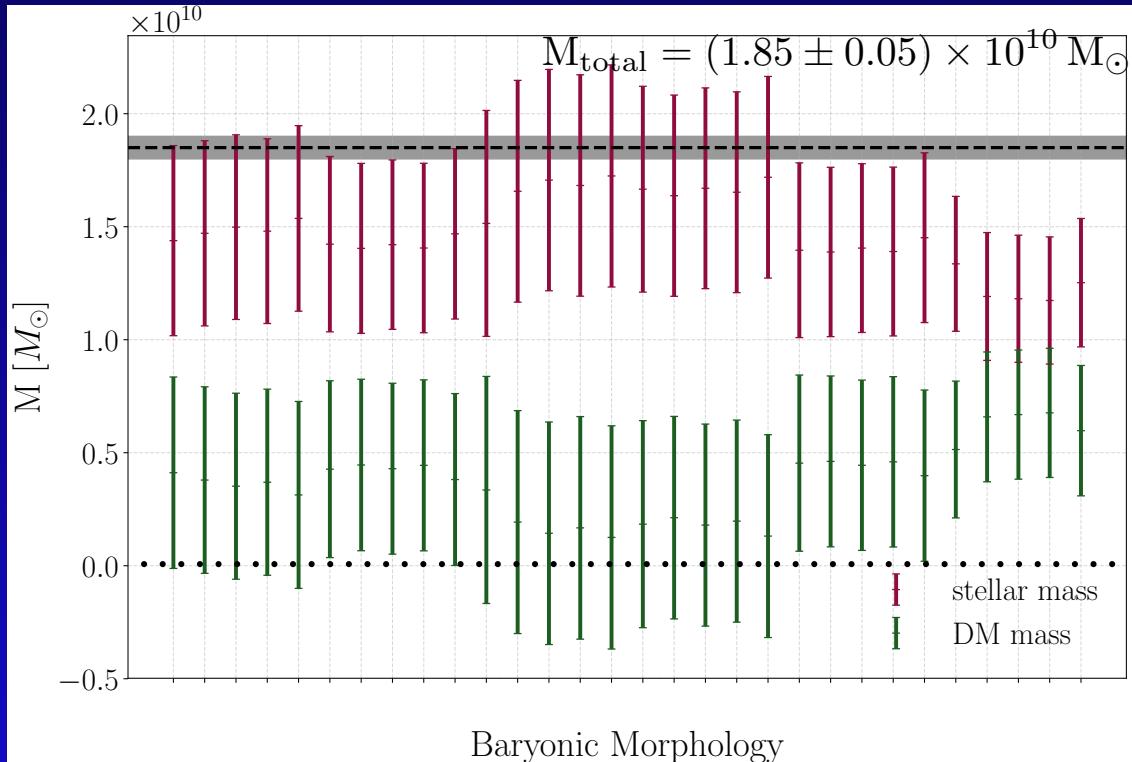
$$M_{\text{total}} - M_*^i = M_{\text{DM}}^i$$

$$\sigma_{M_{\text{DM}}} = \sqrt{\sigma_{M_{\text{total}}}^2 + \sigma_{M_*^i}^2}$$

$$M_* = (1.1 - 1.7) \times 10^{10} M_\odot$$

$$M_{\text{DM}} = (0.1 - 0.7) \times 10^{10} M_\odot$$

DM mass corresponds to 7-37%



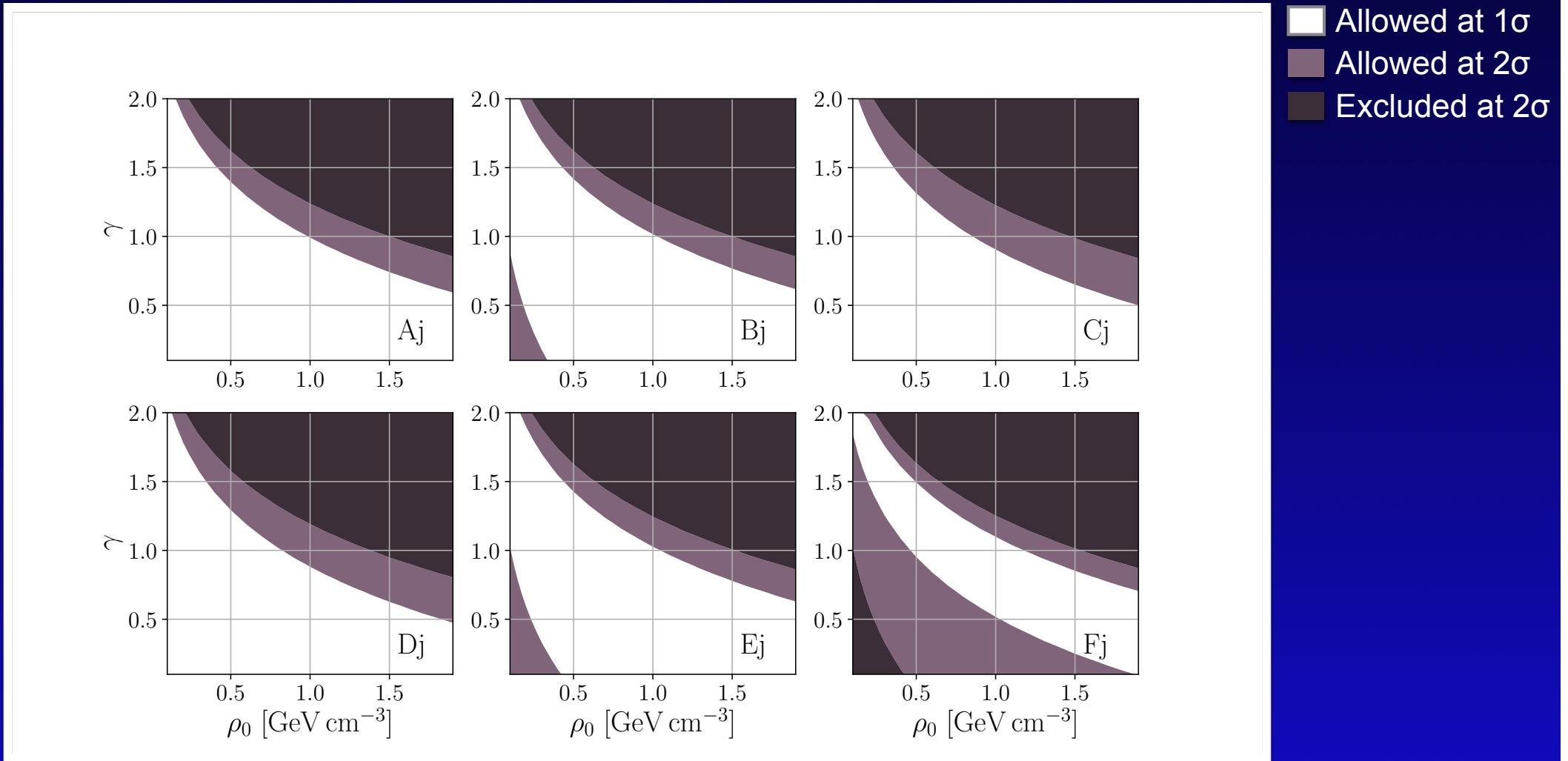
gNFW density profile

$$\rho_{\text{DM}}(r) = \rho_0 \left(\frac{R_0}{r} \right)^\gamma \left(\frac{R_s + R_0}{R_s + r} \right)^{3-\gamma}$$

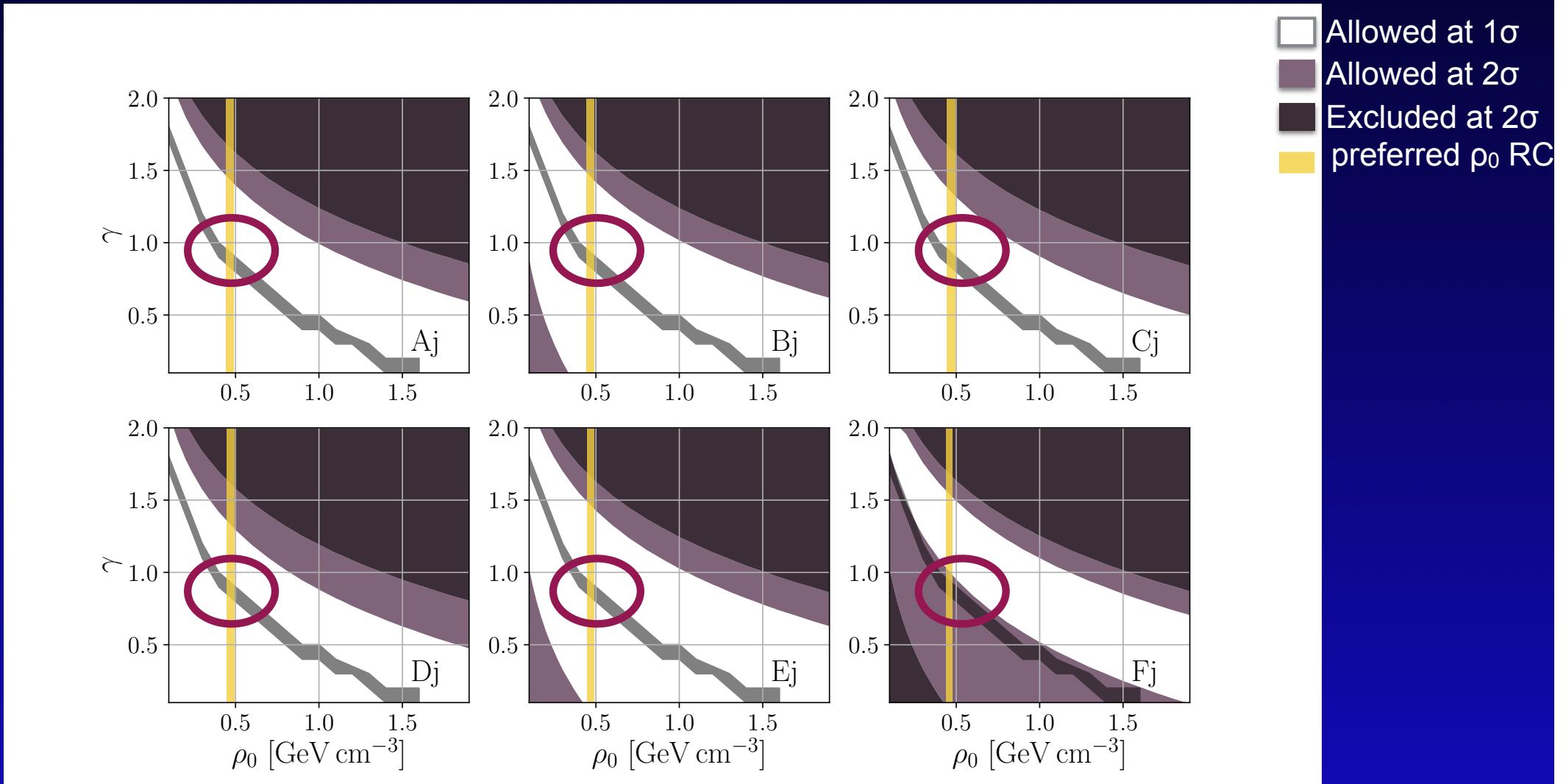
Study parameter space that gives a mass in excess or deficit with respect to the allowed DM mass

Galactic Bulge Region

Results: varying bulge morphology



Galactic Bulge Region and RC curve compatibility



$$M_{\text{DM}} = (0.32 \pm 0.05) \times 10^{10} M_{\odot}$$

“the dark matter density of our model has a [...] shallow cusp or a **core in the bulge region**”

Portail +
MNRAS 465 (2017)

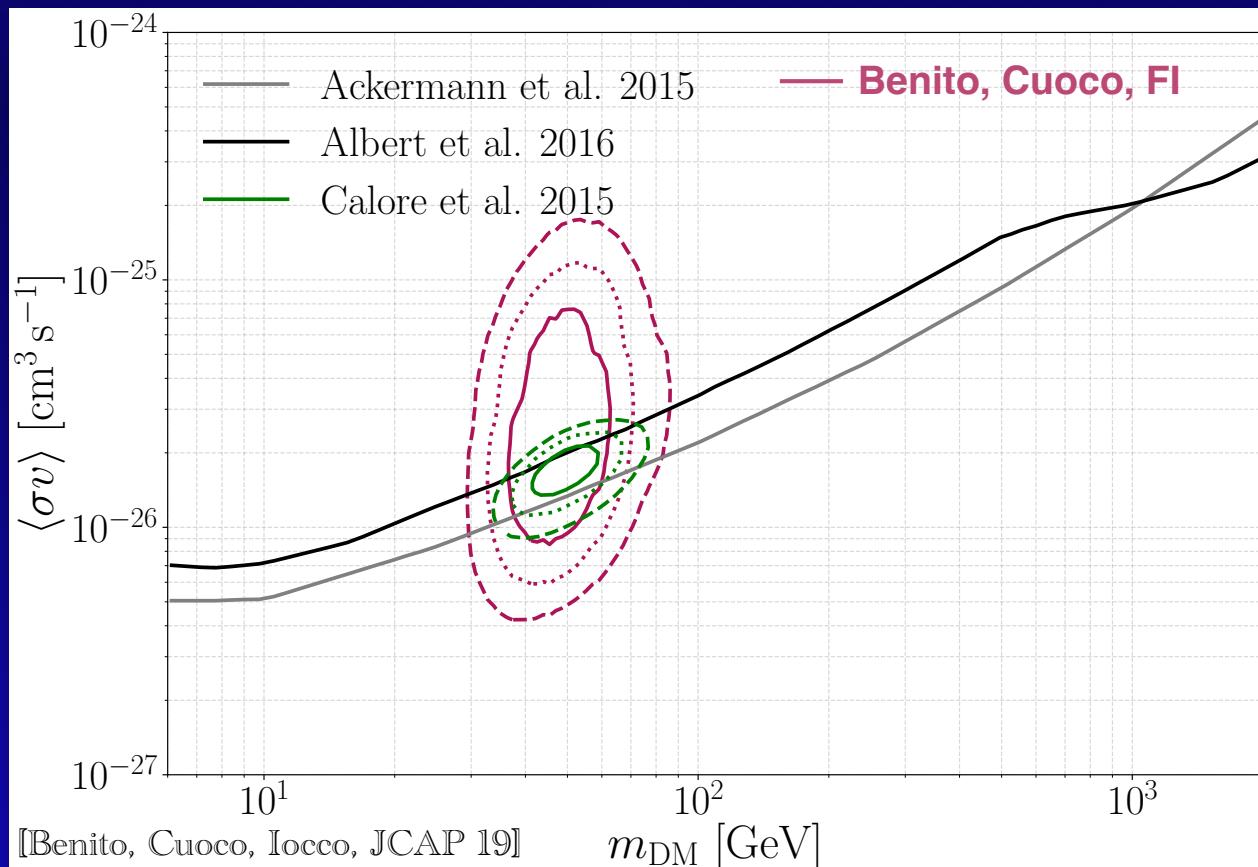
[Iocco & Benito, 2017]

arXiv:1611.09861

(+ M. Benito’s thesis)

The effect of astrophysical uncertainties on the determination of new physics

Uncertainties accounted for:



Calore analysis:

observed GC signal
(only stat. on gamma flux)

This analysis:

observed GC signal
+
DM density profile
(Gal. Param. + Morphologies + stat)

Ready-to-use likelihood publicly available @

[https://github.com/mariabenitocst/
UncertaintiesDMinTheMW](https://github.com/mariabenitocst/UncertaintiesDMinTheMW)

with Gaia-era
(R_0, v_0) determination,
updated in 2020

Let's quantify this effect in a specific case:
Singlet Scalar DM

$$V = \mu_H^2 |H|^2 + \lambda_H |H|^4 + \mu_S^2 S^2 + \lambda_S S^4 + \lambda_{HS} |H|^2 S^2$$

$$v_H = 246 \text{ GeV} \quad \langle S \rangle = 0$$

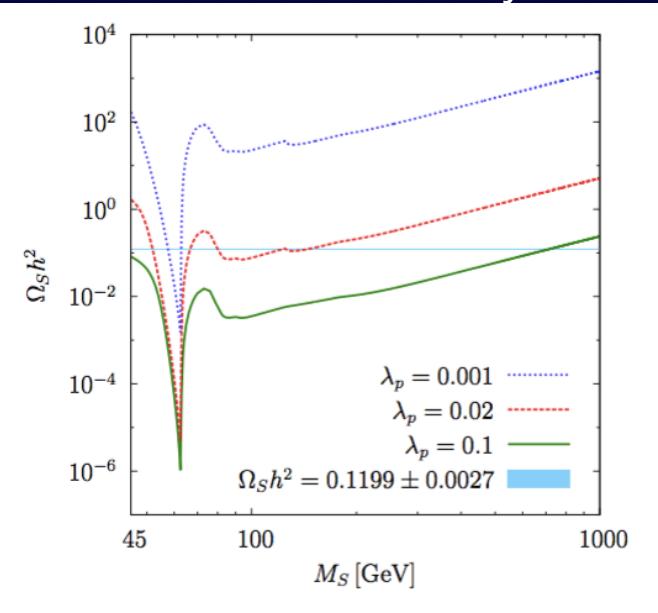
$$m_S^2 = 2 \mu_S^2 + \lambda_{HS} v_H^2$$

“WIMP phenomenology” entirely dictated by the Higgs coupling and physical DM mass.

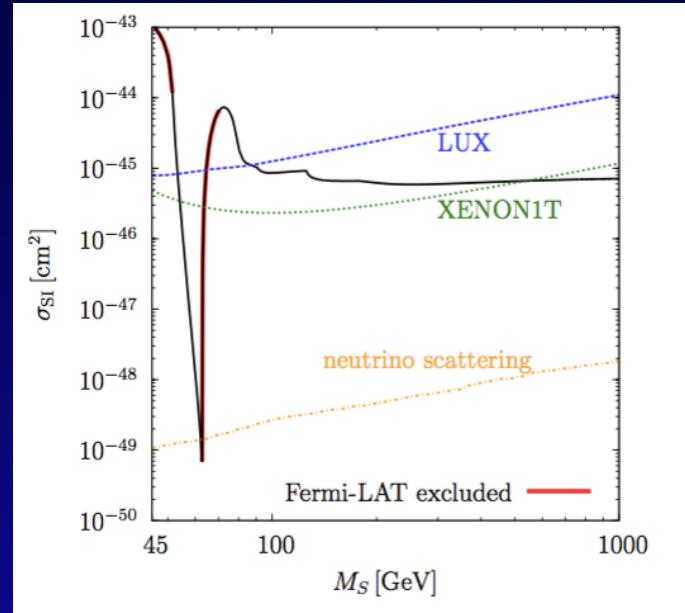
Singlet Scalar DM

Constraints and interplay of experiments

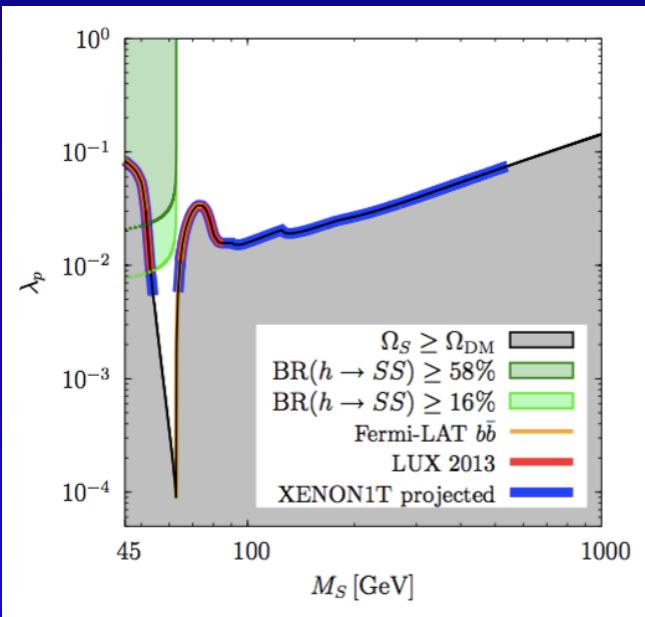
Relic density



Direct detection



Combined

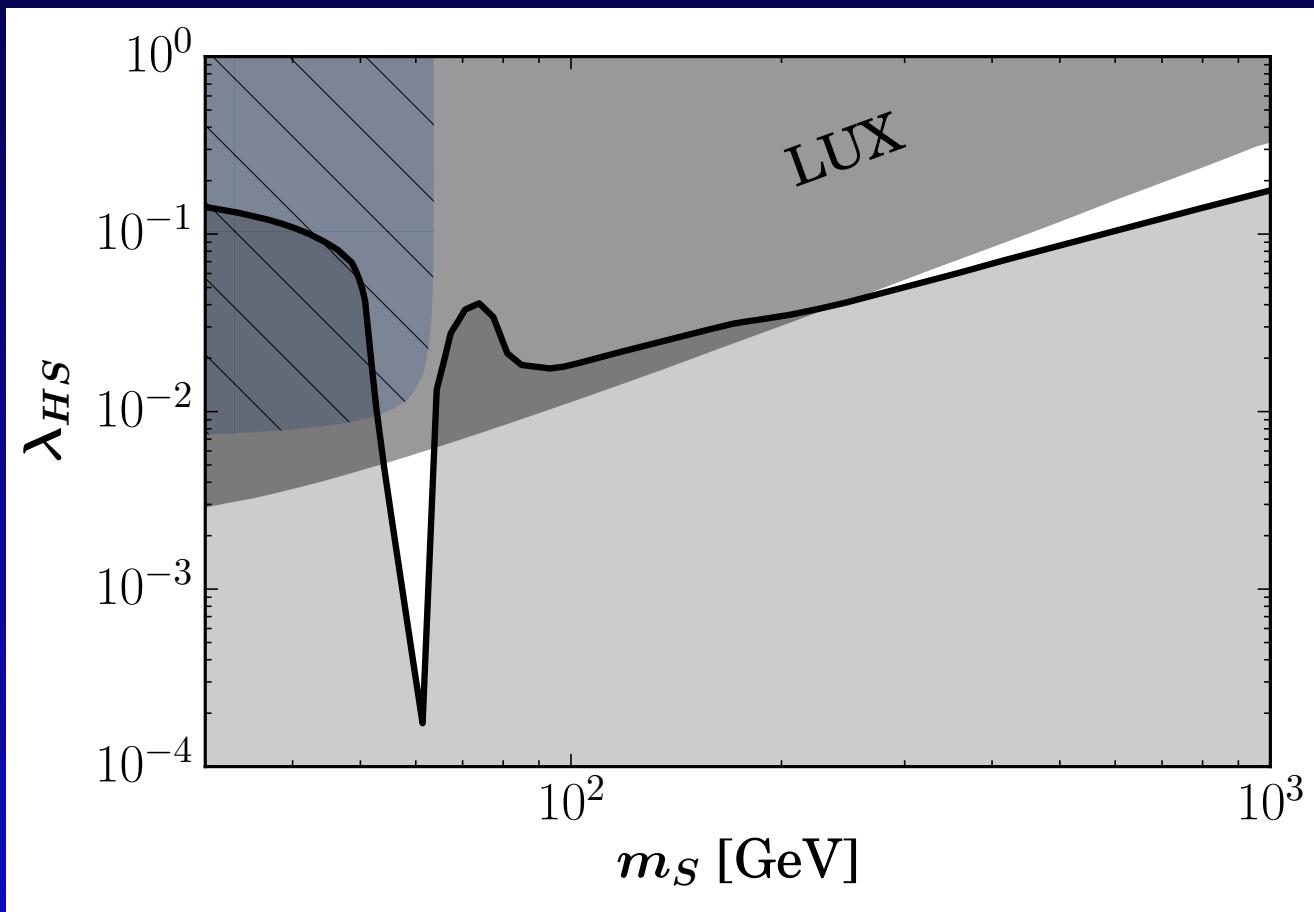


[Duerr et al, 2015]

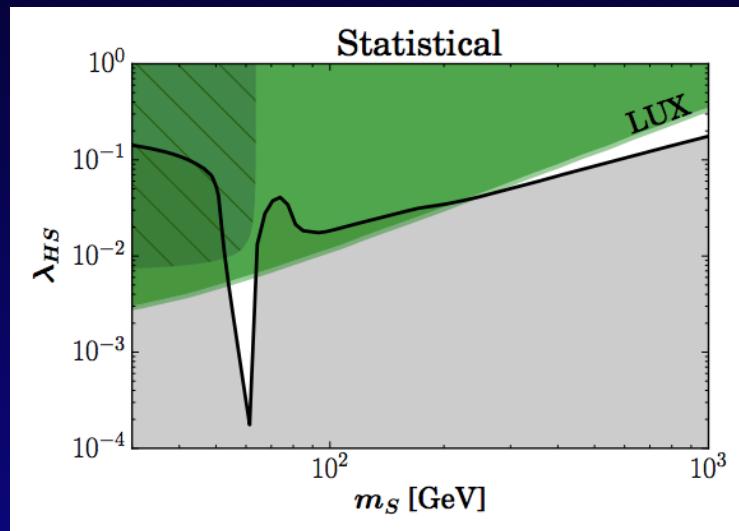
Singlet Scalar DM

Constraints and interplay of experiments

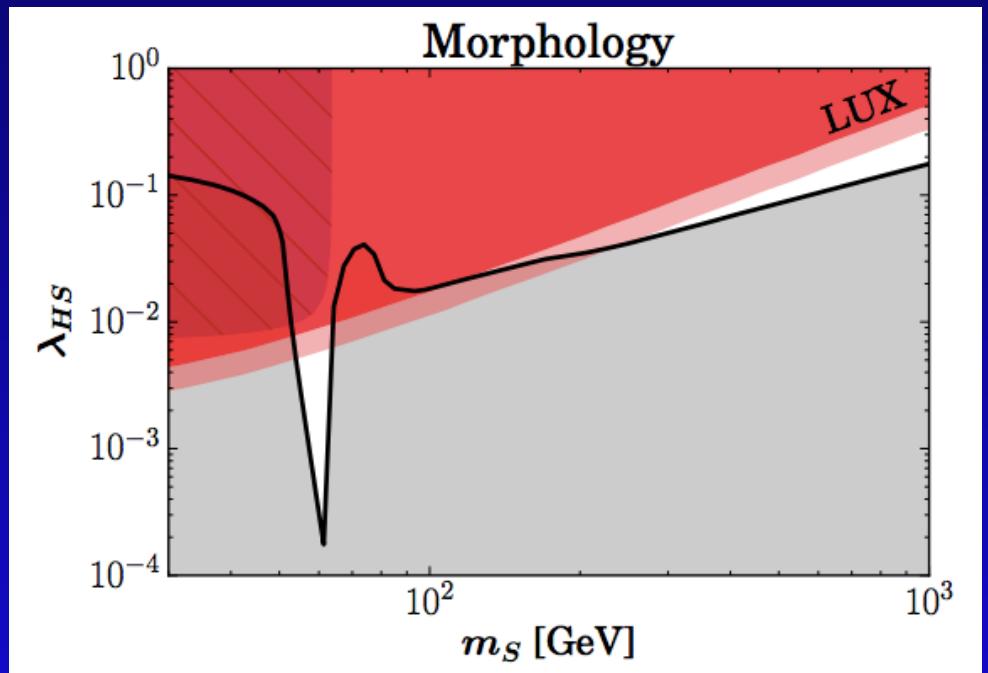
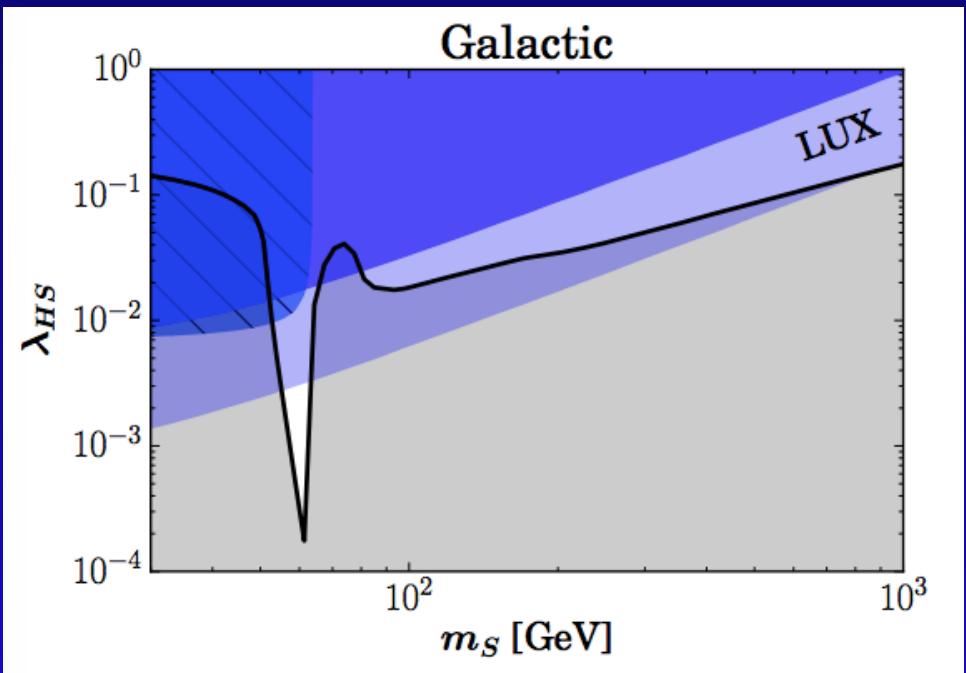
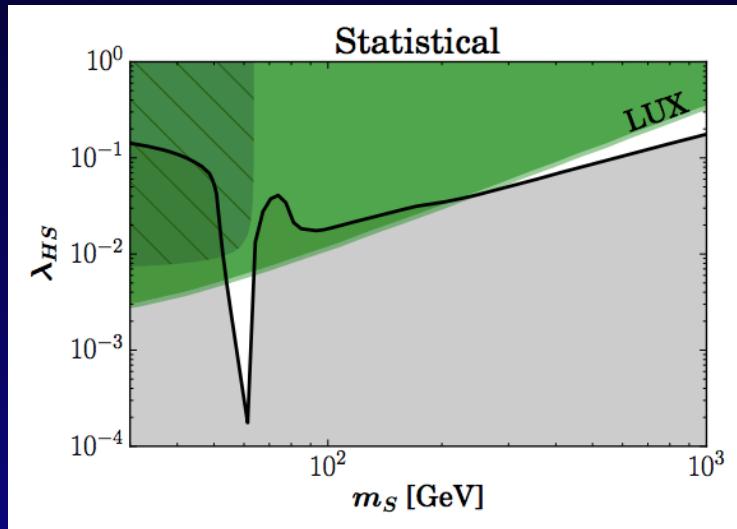
$$V = \mu_H^2 |H|^2 + \lambda_H |H|^4 + \mu_S^2 S^2 + \lambda_S S^4 + \lambda_{HS} |H|^2 S^2$$



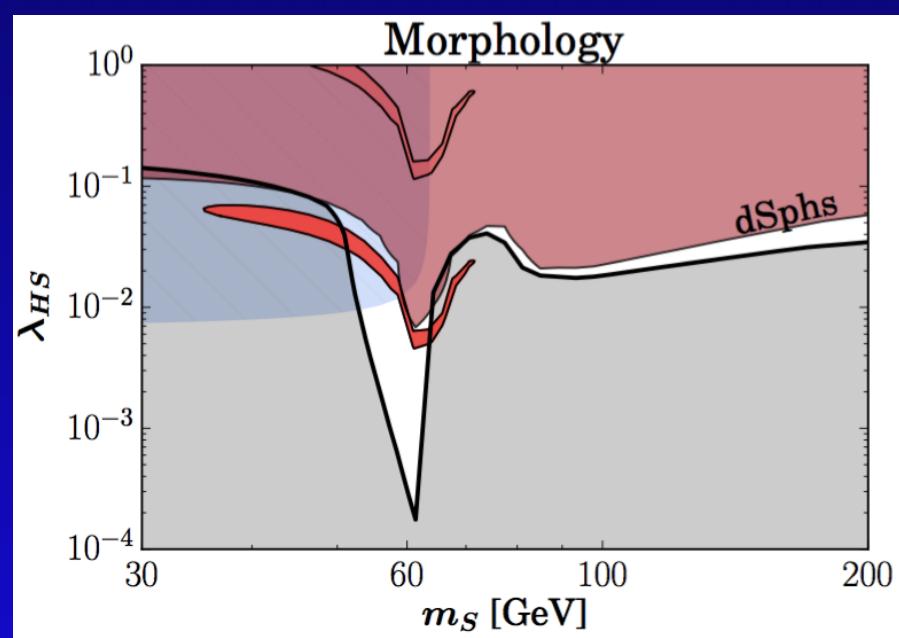
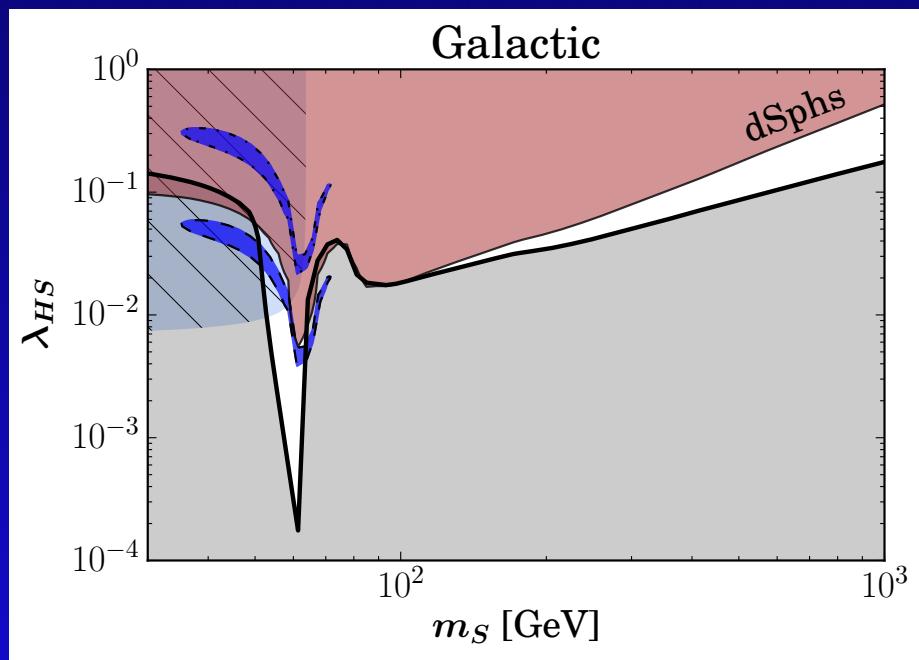
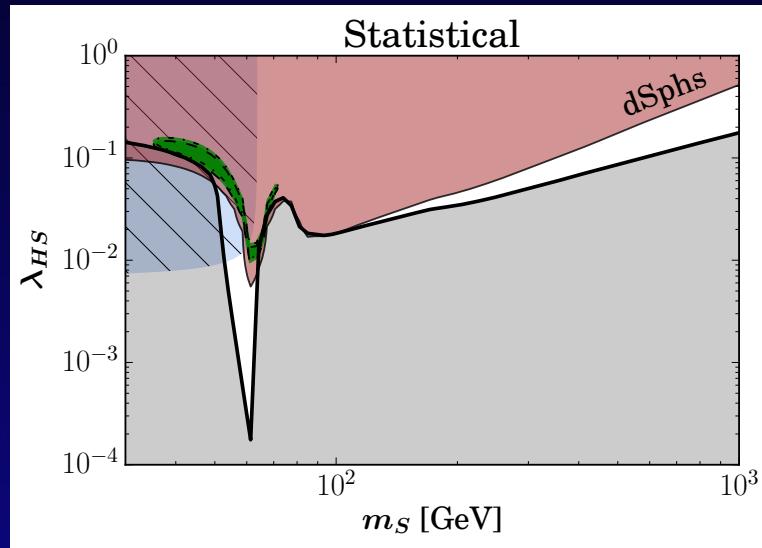
Let's look at the effect of astrophysics uncertainties: Direct Detection



Let's look at the effect of astrophysics uncertainties: Direct Detection



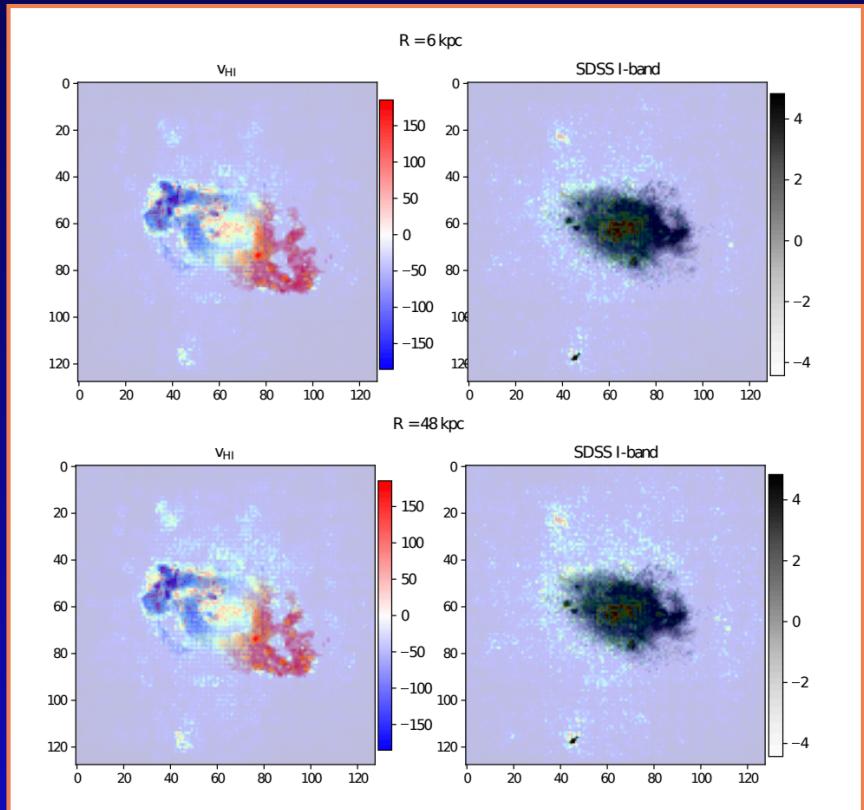
Let's look at the effect of astrophysics uncertainties: Indirect Detection



Cuncta stricte

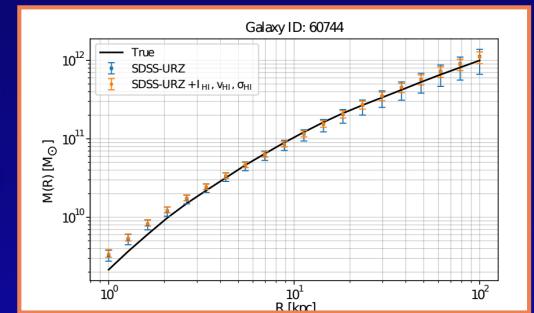
- It is possible to reconstruct the DM distribution of our own Galaxy (with some inherent uncertainties).
- Gaia data should not have you worried about the local DM. (Gaia should have you excited for many other reasons, though).
- Total mass determination is solid, local DM density is solid, slope/profile mhh-mhh (not reliable).
- Forget about the galactic centre.
- Going beyond RC methods for MW-like: a method which is environment tested (tool accuracy).
- Deep learning algorithms do actually reconstruct the DM amount and distribution, within a synthetic environment (simulations).

DM in disk galaxies: is there a better method than Rotation Curves?



photometry + spectroscopy

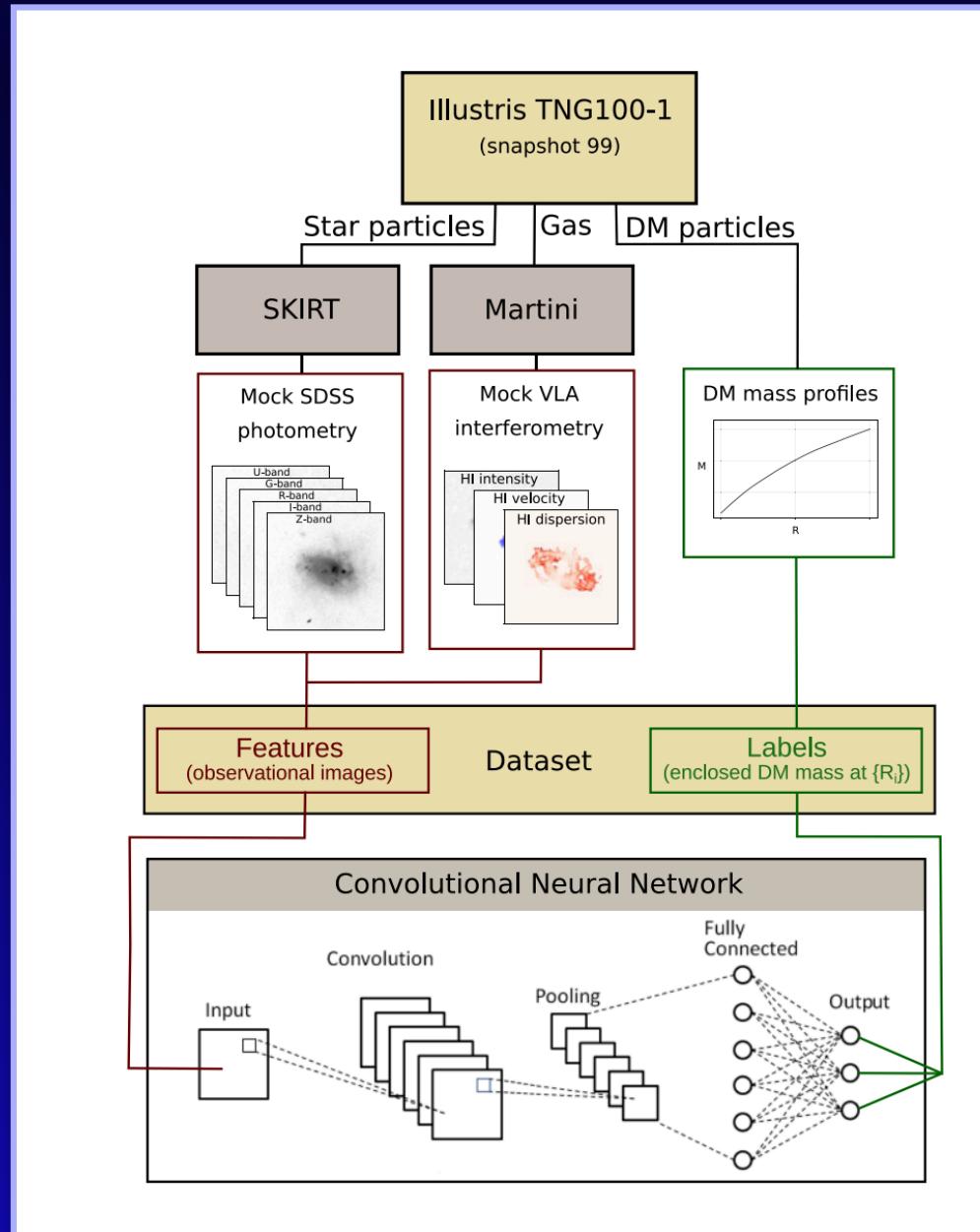
assumptions



DM distr.



The rationale of our machine algorithms



[deLosRios, Petac,
Zaldivar, Calore,
Bonaventura, FI
arXiv:2111.08725]

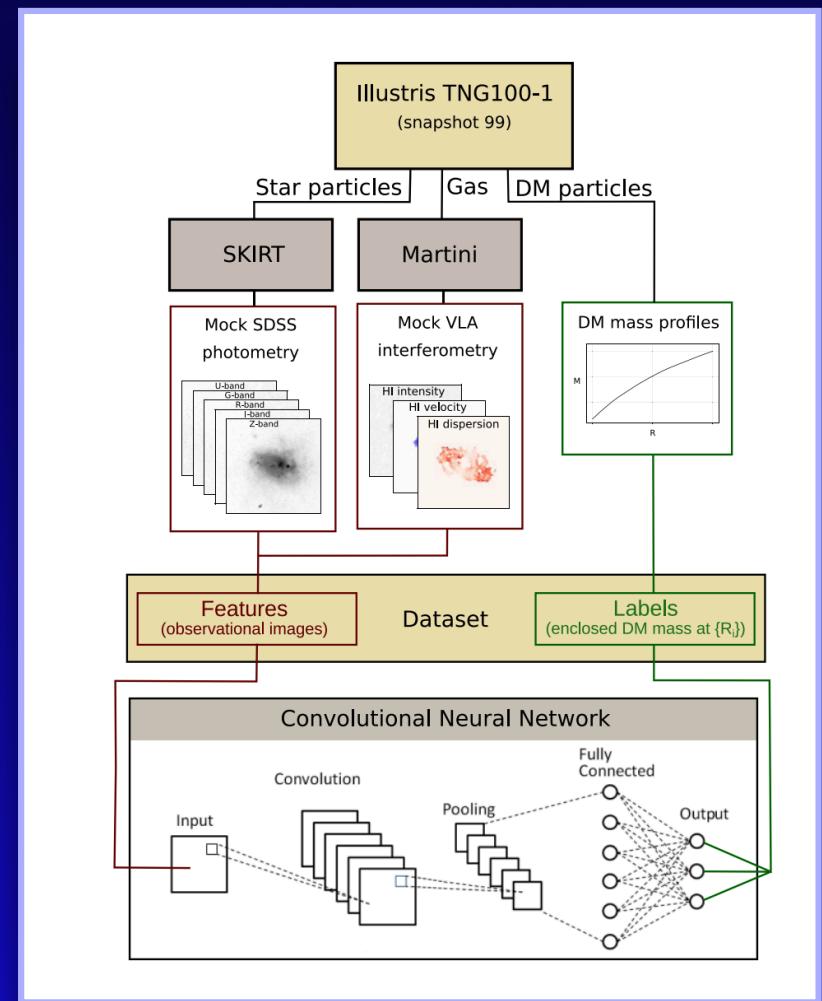
Choice of galaxies in our database

TNG100 Simulation

- Planck cosmology
- 106.5 Mpc by side
- 1820^3 DM particles
- 1820^3 hydrodynamic cells
- DM resolution $7.5 \times 10^6 M_\odot$
- Baryon resolution $1.4 \times 10^6 M_\odot$
- 136 snapshots from $z=127$ to $z=0$

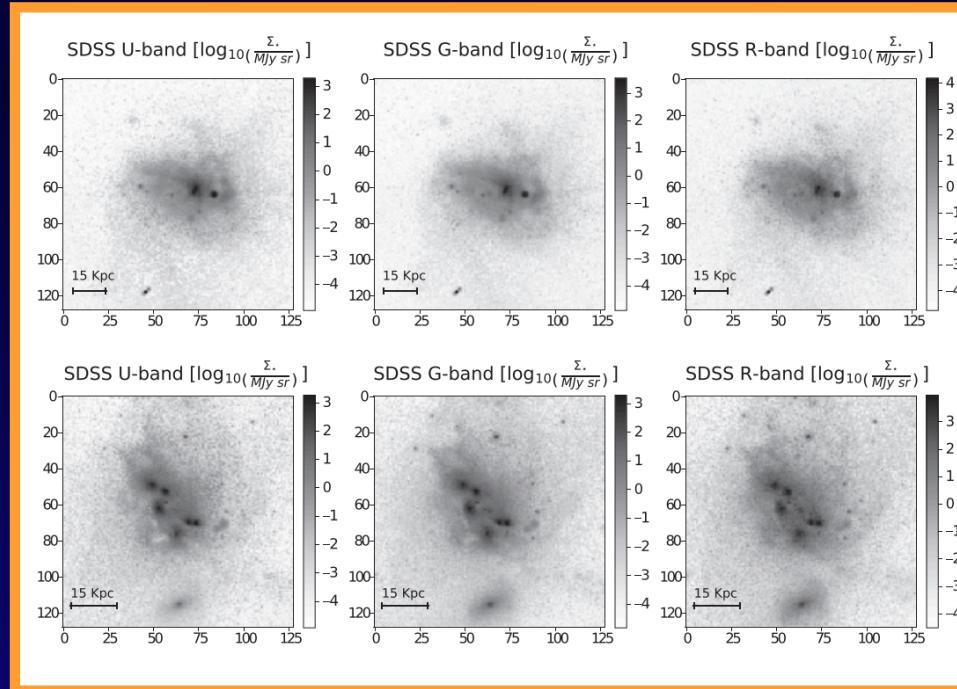
Property	Criterium
Simulation snapshot	99 ($z = 0$)
Stellar mass	$10^{10} M_\odot \leq M_\star \leq 10^{12} M_\odot$
Star formation rate	$SFR \geq 0.1 M_\odot/\text{yr}$
Central galaxy	SubhaloParent = 0
Cosmological origin	SubhaloFlag = 1

[deLosRios, Petac,
Zaldivar, Calore,
Bonaventura, FI
arXiv:2111.08725]



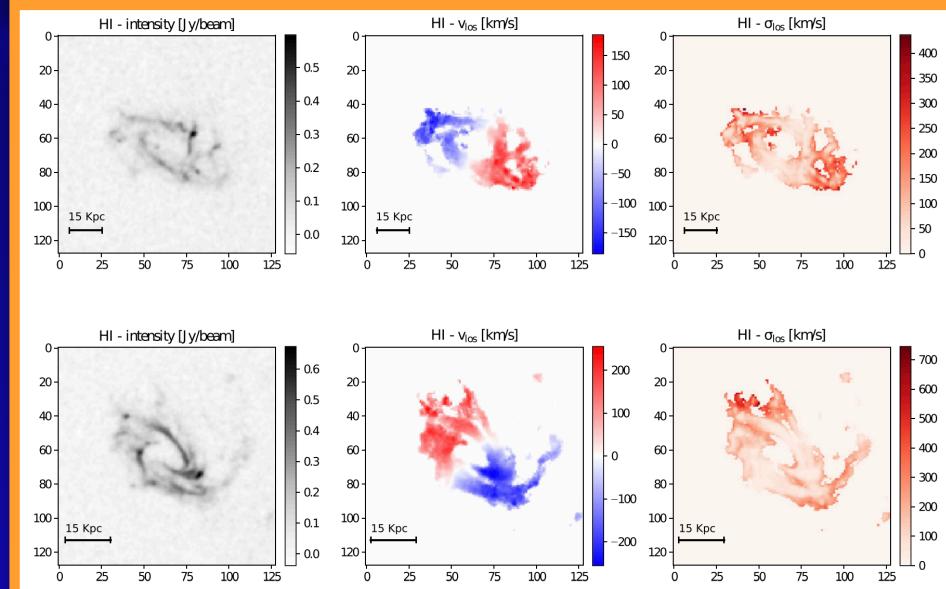
A flavor of what machines “see”

Photometry



Baryons

Spectroscopy

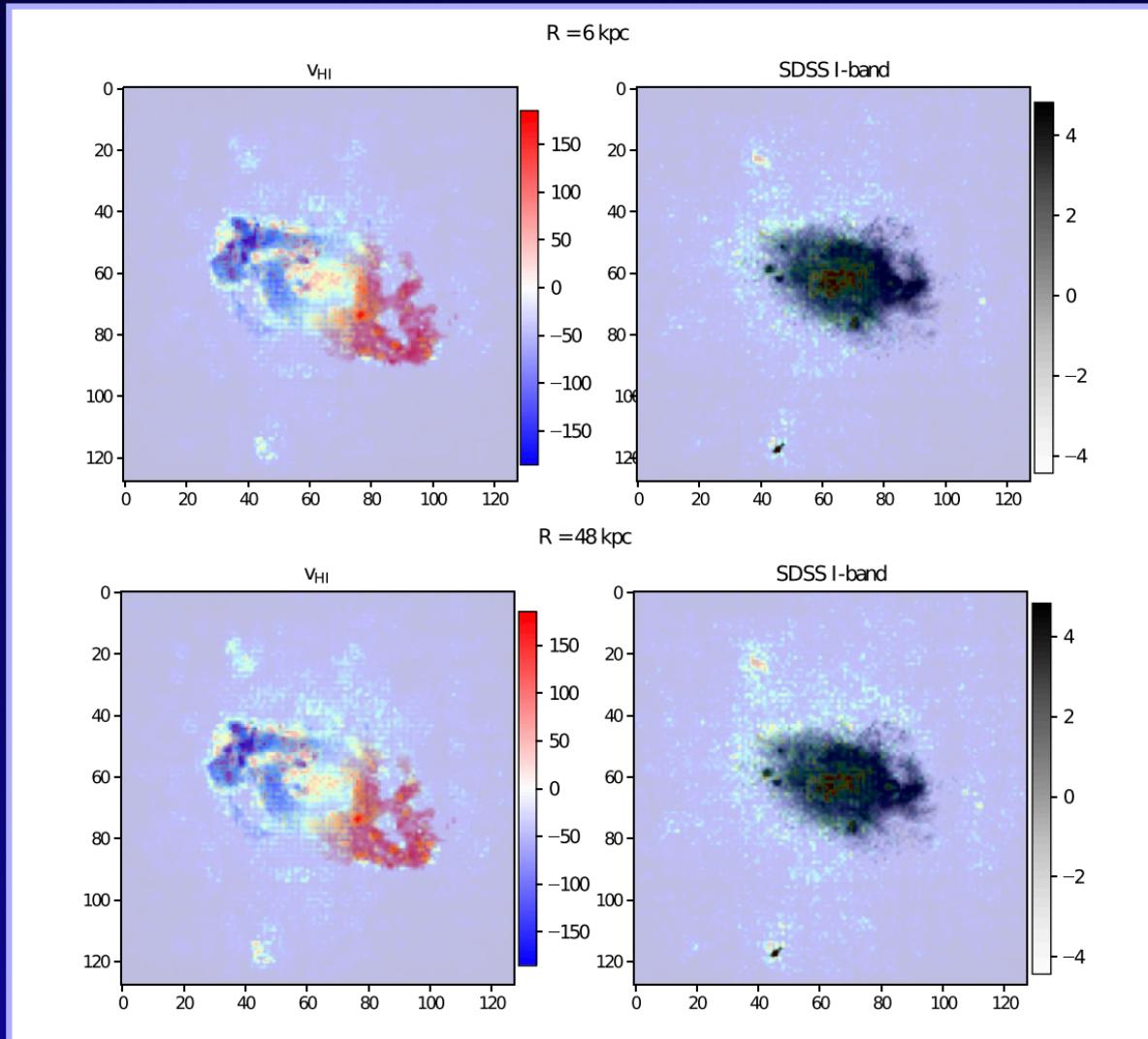


Velocity
(total potential)

[deLosRios, Petac,
Zaldivar, Calore,
Bonaventura, FI

arXiv:2111.08725]

A flavor of what machines “see”

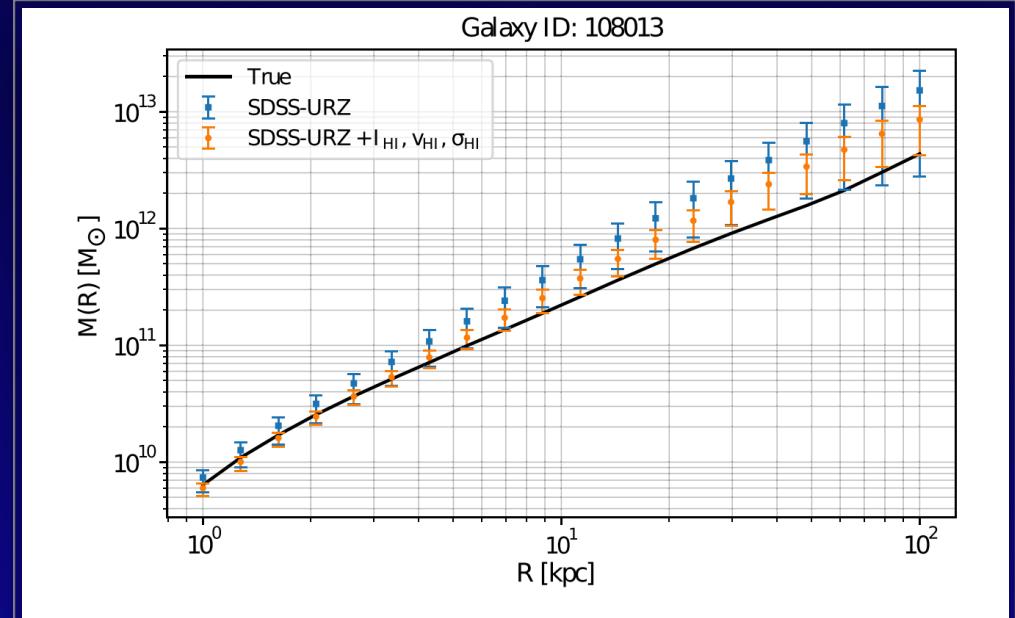
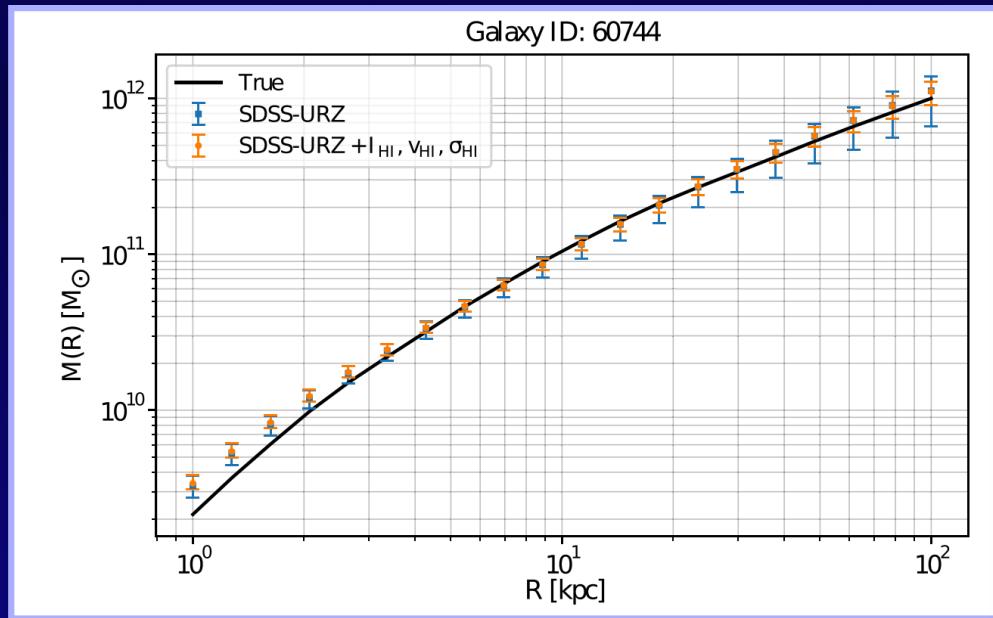


Spectroscopy

Photometry

[deLosRios, Petac,
Zaldivar, Calore,
Bonaventura, FI
arXiV:2111.08725]

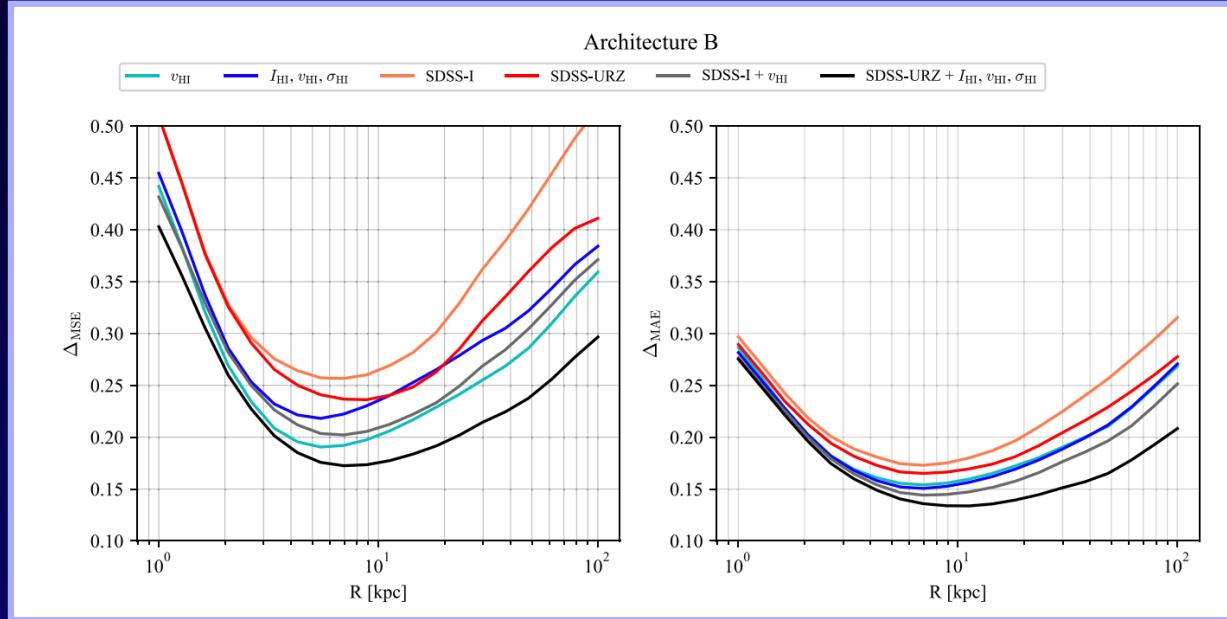
Let's open the box



No “fitting” to pre-existing shape: free reconstruction

[deLosRios, Petac,
Zaldivar, Calore,
Bonaventura, FI
arXiv:[2111.08725](https://arxiv.org/abs/2111.08725)]

It's always about the performance

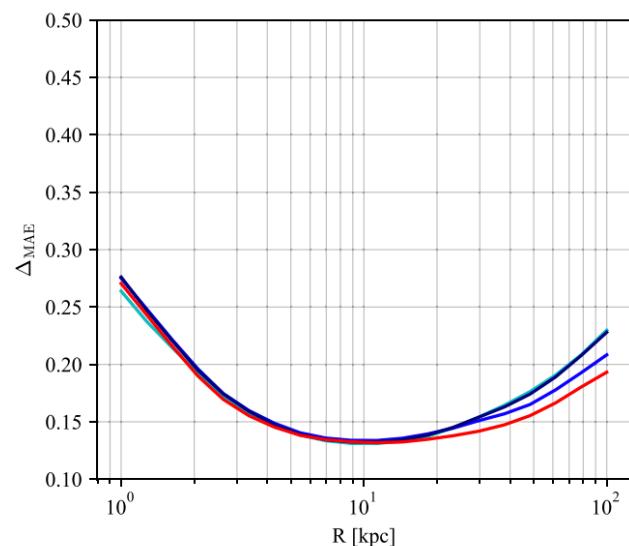
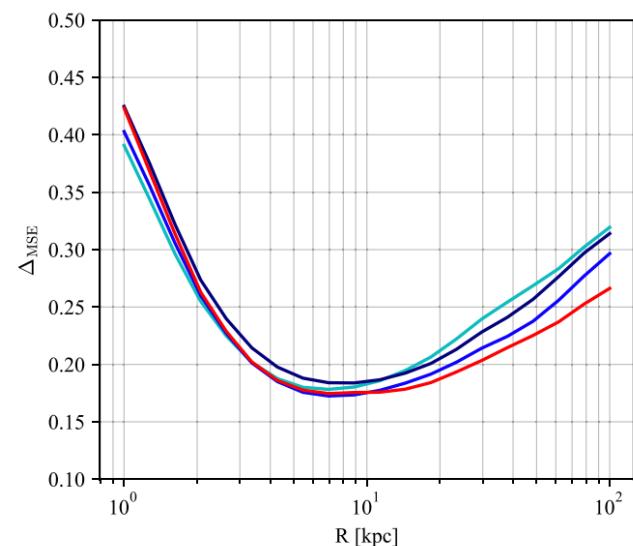


$$\Delta_{\text{MSE}}(R_i) = \left[\frac{1}{N} \sum_{j=1}^N (\mu_j(R_i) - \hat{\mu}_j(R_i))^2 \right]^{1/2}$$

SDSS-URZ + $I_{\text{HI}}, v_{\text{HI}}, \sigma_{\text{HI}}$

- Architecture A
- Architecture B
- Architecture C
- ResNet50

$$\Delta_{\text{MAE}}(R_i) = \frac{1}{N} \sum_{i=j}^N |\mu_j(R_i) - \hat{\mu}_j(R_i)|$$



[deLosRios, Petac
Zaldivar, Calore,
Bonaventura, FI
arXiv:2111.08725]

Rotation Curves vs Machines

