# Search for $\gamma$ -ray emission from dark matter particle interactions from the Andromeda and Triangulum galaxies with the Fermi Large Area Telescope

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The Andromeda (M31) and Triangulum (M33) galaxies are the closest Local Group galaxies to the Milky Way, being only 785 and 870 kpc away. These two galaxies provide an independent view of highenergy processes that are often obscured in our own Galaxy, including possible signals of dark matter (DM) particle interactions. The Fermi Large Area Telescope (Fermi-LAT) preliminary eight year list of sources includes both M31, which is detected as extended with a size of about  $0.4^{\circ}$ , and M33, which is detected as a pointlike source. The spatial morphology of M31  $\gamma$ -ray emission could trace a population of unresolved sources and energetic particles originating in sources not related to massive star formation. Alternatively, the  $\gamma$ -ray emission could also be an indication of annihilation or decay of DM particles. We investigate these two possibilities using almost 10 years of data from the Fermi-LAT. An interpretation that involves only a DM  $\gamma$ -ray emission is in tension with the current limits from other searches, such as those targeting Milky Way dwarf spheroidal galaxies. When we include a template of astrophysical emission, tuned on  $\gamma$ -ray data or from observations of these galaxies in other wavelengths, we do not find any significant evidence for a DM contribution and we set limits for the annihilation cross section that probe the thermal cross section for DM masses up to a few tens of GeV in the  $b\bar{b}$  and  $\tau^+\tau^-$  channels. For models where the DM substructures have masses above  $10^{-6}$  solar masses our limits probe the DM interpretation of the Fermi-LAT Galactic center excess. We provide also the lower limit for the DM lifetime assuming the same spatial models of the DM distribution in M31 and M33.

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#### I. INTRODUCTION

It has been clear for many decades that the Universe includes a significant component of matter which is not made of any known particles of the Standard Model of particle physics. This form of matter is called dark matter (DM) because, though solid observational evidence exists for its gravitational influence from the earliest moments of the Universe's history [1–4], no direct measurements have been made so far of its particle nature.

Though by no means the only possibility, a theoretically well motivated class of DM models includes interactions between DM and Standard Model particles that are approximately as strong as the weak nuclear force and a mass of similar scale (~10–1000 GeV). Such weakly interacting massive particles (WIMPs) would generically attain the observed DM density after thermal freeze-out in the early universe. The canonical "WIMP" is a ~100 GeV particle interacting through the  $SU(2)_L$  weak force, although many other candidates have been proposed with a wide range of masses and interaction strengths [5,6].

The WIMP models provide a useful benchmark for DM searches designed to look for the present-day pair annihilation (or decay) of DM particles in regions of high density of DM. A thermally averaged annihilation cross section of  $\langle \sigma v \rangle \sim 3 \times 10^{-26}$  cm<sup>3</sup>/s would provide approximately the correct WIMP relic density at present, and so experiments capable of seeing the present-day annihilation of DM with cross sections near this value have the sensitivity to either

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confirm or exclude a large number of theoretically interesting models.

In terms of couplings to Standard Model particles, there are many possibilities for dominant annihilation (or decaying) channels. Of particular interest is annihilation or decay resulting in monochromatic  $\gamma$  rays, as this signature is more easily distinguished from other astrophysical sources. However, as this is a loop interaction (DM does not couple to photons directly), this channel is suppressed; thus, searches for this signature are challenging. In addition to the direct annihilation to pairs of  $\gamma$ -ray photons, if DM annihilates into pairs of other Standard Model particles, the resulting hadronization and/or decay will result in a continuum of  $\gamma$  rays observable from Earth with an energy distribution that extends up to the rest mass of the DM particle.  $\gamma$  rays produced in the local universe are relatively unaffected by their propagation in the interstellar medium; thus they arrive at the Earth unscattered and unattenuated. This allows us to trace the  $\gamma$ -ray emission spatial distribution and spectral information back to its original source. Thus,  $\gamma$ -ray observations together with separate information or assumptions about the distribution of DM in the regions under study and models for the hadronization allow for measurement of, or determination of upper limits for, the annihilation cross section.

With this motivation in mind,  $\gamma$ -ray data measured by the Large Area Telescope (LAT) carried by the Fermi Gammaray Space Telescope (Fermi-LAT) are of great interest. The Fermi-LAT is a pair-conversion telescope. Incoming  $\gamma$  rays pass through the anticoincidence detector and convert in a silicon strip tracker to  $e^+/e^-$  pairs. The charged particle direction is reconstructed using the information in the tracker, and the energy is estimated from depositions in a CsI calorimeter. Detailed descriptions of the LAT and its performance can be found in dedicated papers [7,8]. At the present time, the Fermi-LAT is one of the most sensitive instruments to DM particles with weak-scale mass and producing  $\gamma$  rays. Analysis of the LAT  $\gamma$ -ray data can place strong limits on—or discover—DM annihilation with cross sections near the canonical thermal value into a wide variety of Standard Model particles [9].

A large number of DM searches have been performed using Fermi-LAT data. Since annihilation rates are proportional to the square of the DM density, lower annihilation cross sections can be probed by targeting regions in the local universe with the greatest densities of DM, such as the center of the Milky Way (MW) [10–16], satellite dwarf spheroidal galaxies of the MW [17–23], unresolved halo substructures [24–27], galaxy clusters [28,29], and the Large and Small Magellanic Clouds (LMC and SMC) [30,31].

The direction with the predicted brightest  $\gamma$ -ray emission from DM is toward the Galactic center. The LAT observations of the Galactic center indicate that the region is brighter than expected from standard models for Galactic diffuse emission at GeV energies, and the spatial distribution is broadly consistent with our expectations for a DM signal (see, e.g., [32]). However, previously unconsidered astrophysical backgrounds could match the observed morphology and spectrum, and the true source of the  $\gamma$  rays remains a subject of much debate, with an unresolved population of millisecond pulsars (MSPs) or a past transient event at the Galactic center being some of the most popular interpretations [33–39]. Considering both the broad interest in indirect searches for DM, and the current questions raised by the Galactic center excess, it is important to identify new high-density targets for DM annihilation indirect searches.

Nearby galaxies, such as Andromeda (M31) and Triangulum (M33), offer a great opportunity to test the origin of the Galactic center excess and to look for signals of DM particles. They are close enough (approximately 785 kpc and 870 kpc away, respectively<sup>1</sup>) so that their stellar disks and bulges can be resolved as two separate components between radio and x-ray energies which is not possible in our Galaxy, since our bulge is obscured by the bright disk emission. It is worth noting that Andromeda in particular was one of the astrophysical objects where compelling evidence for the existence of DM was first brought forward and shaped our understanding of the Universe (see, e.g., [40]).

M31 was first detected in  $\gamma$  rays by the LAT at a significance of 5.3 standard deviations ( $\sigma$ ) with a marginal spatial extension (significance of  $\sim 1.8\sigma$ ) [41]. M31, with its disk, has an angular size of over 3° and is therefore one of the rare nearby galaxies that can be spatially resolved by Fermi-LAT. A more recent analysis [42] revisited M31 with more than 7 years of Pass 8 observations, detected the galaxy at a significance of nearly  $10\sigma$ , and confirmed the spatial extension at  $4\sigma$  significance with a size of about 0.4°. M31 has been detected with a similar size of extension also in [43]. Its spectrum is consistent with a power law with an index of  $2.4 \pm 0.1$ . The spatial distribution of the emission is consistent with a uniform-brightness disk over the plane of sky with a radius of 0.4° and no offset from the center of M31. The flux from M31 appears confined to the inner regions of the galaxy and does not fill the disk of the galaxy or extend far from it. Since the spatial morphology of the  $\gamma$ -ray signal is not compatible with the M31 disk, which is a region rich of gas and star formation activity, the emission probably is not interstellar in origin, unless the energetic particles radiating in  $\gamma$  rays originate in relatively old star formation activities. Alternative interpretations are that the emission results from a population of MSPs located in the bulge of M31 [44] or from the decay or annihilation of DM particles, similar to what has been proposed to account for the Galactic center excess found in Fermi-LAT observations of the MW.

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On the other hand, M33 was not detected significantly by the LAT team in [42] in an analysis using only  $\gamma$  rays with energies above 1 GeV, and it has been detected as pointlike in the Fermi-LAT 8 year source list<sup>2</sup> (FL8Y) with a significance of about 4.1 $\sigma$ .

M31 and M33 are thus natural targets for DM indirect detection searches. As a general strategy of this work, we will apply the techniques developed in the search for DM in the LMC and SMC [30,31], which are both extended  $\gamma$ -ray sources as is M31.

In this paper we analyze almost 10 years of Fermi-LAT data, about two more years than previous analyses, and we dedicate our search to any evidence of a possible DM contribution.

In Sec. II, we describe the DM distribution in M31 and M33 and how it relates to searches for indirect signals of DM annihilation or decay. In Sec. III, we discuss the analysis setup and technique that we apply, we show how the DM signal from these galaxies would be detected by the LAT, and we describe a search for such a signal in the M31 and M33 regions. Finally in Sec. IV we report the results for the annihilation and decay of DM particles, and we conclude in Sec. V.

#### II. M31 AND M33 DARK MATTER FLUX AND SPATIAL DISTRIBUTION

The flux spectrum  $d\phi/dE_{\gamma}$  of  $\gamma$  rays originating in DM decay/annihilation processes can be factored into astrophysics- and particle physics-dependent terms [45]:

decay: 
$$\frac{\mathrm{d}\phi}{\mathrm{d}E_{\gamma}} = \left(\frac{x}{4\pi\tau_{\chi}}\frac{\mathrm{d}N_{\gamma}}{\mathrm{d}E_{\gamma}}\frac{1}{m_{\chi}}\right) \left(\int_{\Delta\Omega}\mathrm{d}\Omega \int_{\mathrm{l.o.s}}\mathrm{d}\ell \,\rho_{\chi}(\vec{\ell})\right),\tag{1}$$

annihilation: 
$$\frac{\mathrm{d}\phi}{\mathrm{d}E_{\gamma}} = \left(\frac{x\langle\sigma v\rangle}{8\pi} \frac{\mathrm{d}N_{\gamma}}{\mathrm{d}E_{\gamma}} \frac{1}{m_{\chi}^{2}}\right) \times \left(\int_{\Delta\Omega} \mathrm{d}\Omega \int_{\mathrm{l.o.s}} \mathrm{d}\ell \,\rho_{\chi}^{2}(\vec{\ell})\right). \quad (2)$$

The quantities in the first parentheses are the DM lifetime  $\tau_{\chi}$  or the thermally averaged annihilation cross section with respect to the velocity distribution of DM particles  $\langle \sigma v \rangle$ , respectively. Moreover, there is the differential yield of  $\gamma$  rays from a single DM annihilation  $dN_{\gamma}/dE_{\gamma}$ , the mass of the DM particle  $m_{\chi}$ , and a normalization factor *x* which is unity if the DM is its own antiparticle and 1/2 otherwise. All of these depend on the unknown particle physics model that includes DM particles. The typical approach for DM indirect detection searches, as we will follow here, is to set an upper (lower) bound, if no excess is observed, on  $\langle \sigma v \rangle$ 

 $(\tau_{\chi})$  as a function of the DM mass  $m_{\chi}$  while assuming a particular annihilation (decay) channel and its associated spectrum  $dN_{\chi}/dE_{\chi}$ .

In this paper, we assume x = 1 and consider the final states  $b\bar{b}$  and  $\tau^+\tau^-$ , which have been of particular interest given the Galactic center excess. Other sets of Standard Model final states are possible but have sufficient similarity to the channels selected that bounds can be extrapolated reasonably. In this work, we calculate the spectrum  $dN_{\gamma}/dE_{\gamma}$  for each chosen final state and DM mass using a code available as part of the Fermi-LAT ScienceTools.<sup>3</sup> Note that our implementation does not include electroweak corrections [47–51]. Such corrections can be important for heavy DM ( $m_{\chi} \gtrsim 1$  TeV); in any case, they would increase the resulting flux and, thus, strengthen the resulting bounds [51–53].

In order to describe experimental results in terms of the particle physics parameters, the astrophysical quantities in the second set of parentheses in Eq. (2) must be known. The integral of the DM density along the line of sight and over a solid angle  $\Delta\Omega$  corresponding to the region under study, is known as the *J* factor (or *D* factor in the case of decaying DM) and encapsulates the dependence of an indirect detection search on the distribution of DM in the search target. Of particular interest is the case of annihilating DM where the *J* factor depends on the DM density squared and also implicitly on the inverse distance squared. Hence, targeting nearby overdensities of DM yields larger values of the *J* factor. Such targets are, thus, very well suited to probe smaller annihilation cross sections  $\langle \sigma v \rangle$ .

To apply the indirect search pipeline that has been developed to study the DM content of the LMC and SMC, we must first determine the DM density distribution of M31 and M33, that is to calculate their expected J factor (D factor). This task is of a complex nature as N-body simulations of the formation and evolution of MW-sized galaxies predict a hierarchical formation scenario. The DM halo of spiral galaxies, such as the one of M31 or M33, is expected to form by mergers of small overdensities which are referred to as subhalos. Depending on the particle resolution of the respective *N*-body simulation ([54–56]), around 10%–20% of the mass of a MW-sized galaxy's DM halo has been found to be present in the form of substructure. An extrapolation of these results to less massive, and yet unresolved, subhalos seems to predict that in the most extreme scenario about 50% of a DM halo's mass stems from substructures. This strongly affects  $\gamma$ -ray indirect DM searches because a population of DM subhalos can boost the J factor of the parent halo substantially [57,58]. The D factor of a DM halo, on the other side, is mostly unaffected by the presence of substructure since it

<sup>&</sup>lt;sup>2</sup>https://fermi.gsfc.nasa.gov/ssc/data/access/lat/fl8y/gll\_psc\_ 8year\_v5.fit

<sup>&</sup>lt;sup>3</sup>The DMFitFunction spectral model described at http://fermi .gsfc.nasa.gov/ssc/data/analysis/documentation/Cicerone/ Cicerone\_Likelihood/Model\_Selection.html; see also Ref. [46].

grows linear in the DM density. Nonetheless, the region exhibiting the largest J/D factor in a galaxy is its center where the DM density is dominated by the profile of the smooth parent halo. The observed origin of the extended gamma-ray emission from M31 is coinciding with its central region so that we are required to carefully select smooth DM halos for M31 (and M33) that, on the one side, cover the full variety of existing DM profile types and, on the other side, are in accordance with the available stellar data.

As a matter of fact, M31 seems to be the only wellstudied galaxy which was argued to require the effect of adiabatic contraction around its central region [59,60]. Adiabatic contraction is caused by baryonic physics and gravitational interactions between baryons and DM in galaxies. During the formation of a galaxy, typical processes such as gas dissipation, supernova feedback, and star formation lead to substantial energy losses of a sizable fraction of galactic baryons which hence fall into the central region of their host galaxy. As first reported in [61], these particles deepen the gravitational potential of the Galactic center so that the surrounding DM follows the baryonic pull creating a compressed DM halo in the central region. Subsequent hydrodynamical simulations of galaxy formation [62–67] confirm the prediction of adiabatic contraction of DM halo profiles obtained from DM-only simulations. In fact, an adiabatically contracted Navarro-Frenk-White (NFW) profile [68,69] enhances the J factor in the center of M31 which is remarkable since, following a DM interpretation, a large J factor could be the source of the observed extended gamma-ray emission from M31 in this region. The NFW profile is a particular instance [with  $(\alpha, \beta, \gamma) = (1, 3, 1)$ ] of the general Hernquist-Zhao profile [70,71],

$$\rho_{\text{ZHAO}}(r) = \frac{\rho_s}{\left(\frac{r}{r_c}\right)^{\gamma} \left[1 + \left(\frac{r}{r_c}\right)^{\alpha}\right]^{\frac{\beta-\gamma}{\alpha}}},\tag{3}$$

where  $\rho_s$  is a density normalization,  $r_s$  refers to the profiles' scale radius, and  $\alpha$ ,  $\beta$ , and  $\gamma$  determine the inner and outer slopes of  $\rho_{ZHAO}$  as well as the transition between both regimes. These parameter labels are also used in the definitions of other DM density profiles considered in this analysis.

We adopt the smooth adiabatically contracted NFW profile from [60] where it is called "M1 B86." In detail, we read off the "Halo" mass-to-radius curve in their Fig. 6. Afterwards, we convert it into a radial density profile via  $\rho(r) = (4\pi r^2)^{-1} dM/dr$  and interpolate the obtained data points. In fact, the resulting density profile cannot be described by a single set of parameters of the Hernquist-Zhao profile. However, for r < 25.65 kpc (the profile's scale radius) it provides an acceptable—albeit far from good—approximation with the parameters ( $\alpha, \beta, \gamma$ ) = (0.38, 3.84, 1.54).

Alongside this nonstandard DM density distribution, we consider two distinct but frequently used profiles, namely an Einasto profile that provides a better fit to the profile of DM halos derived from *N*-body simulations [72,73] (representing the family of cuspy profiles)

$$\rho_{\rm Ein}(r) = \rho_s \exp\left(-\frac{2}{\alpha} \left[\left(\frac{r}{r_s}\right)^{\alpha} - 1\right]\right) \tag{4}$$

and a Burkert profile [74] (representing the family of cored profiles)

$$\rho_{\text{Burkert}}(r) = \frac{\rho_s}{(1 + \frac{r}{r_s})[1 + (\frac{r}{r_s})^2]}.$$
 (5)

These three DM profiles bracket the range of cosmologically and astrophysically viable DM halo morphologies according to the current understanding of large structure formation and baryonic feedback. As a matter of fact, baryonic physics has been identified not only to be the driving force of an adiabatic contraction of the innermost region of a DM halo but it can also have the opposite effect leading to the formation of a DM core [75]. The infall of baryons into the center of a DM halo is described to trigger a large number of enhanced star formation periods which each time create a massive outflow of baryons from the central region. The DM follows the baryonic flow as this flow causes a shallower gravitational potential so that the inner cusp is successively washed out by the cycles of baryonic infall and a burst in star formation [76–78]. There have been attempts to implement this kind of baryonic feedback in cosmological simulations of structure formation. They confirm a flattening of the inner DM cusp observed in DM-only simulations [75,79]. However, as, for example, pointed out in [80], the impact of baryons on the evolution of a DM halo depends on its properties such as the stellar-to-halo mass ratio. Hence, the ultimate effect of baryonic feedback can vary from galaxy to galaxy.

Regarding the Einasto and Burkert profile of M31, we adopt the set of parameters that has been derived in [81] to match its available kinematical stellar data. As concerns M33, we make the same distinction between cored and cuspy profiles by selecting a Burkert profile<sup>4</sup> and an NFW profile where the respective parameters are taken from [83]. A summary of the adopted profile parameters is found in Table I. In the case of M33's NFW profile and M31's adiabatically contracted NFW profile, we had to calculate  $r_s$  and  $\rho_s$  from the given quantities in the respective references.

<sup>&</sup>lt;sup>4</sup>The admissible Burkert core radii of M33 seem to span a rather wide range [82,83]. The difference is most likely attributed to the chosen analysis approach, rotation curve data selection, and fitting scheme.

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	Smooth profile M31	Smooth profile M33	$\alpha_{ m sub}$	$f_{\rm sub}$	$M_{\rm min}[M_\odot]$	<i>c</i> <sub>200,sub</sub>
MIN	Burkert [84] $r_s = 9.06 \text{ kpc},$ $\rho_s = 3.68 \times 10^7 M_{\odot}/\text{kpc}^3$ $M_{200} = 7.9 \times 10^{11} M_{\odot}$	Burkert [83] $r_s = 9.6 \text{ kpc},$ $\rho_s = 1.23 \times 10^7 M_{\odot}/\text{kpc}^3$ $M_{97.2} = 3.0 \times 10^{11} M_{\odot}$	1.9	0.12	10 <sup>6</sup>	[85]
MED	Einasto [84] $r_s = 178 \text{ kpc},$ $\rho_s = 8.12 \times 10^3 M_{\odot}/\text{kpc}^3$ $M_{200} = 1.13 \times 10^{12} M_{\odot}$	NFW [83] $r_s = 22.41$ kpc,	1.9	0.19	10 <sup>-6</sup>	
MAX	Adiabatically contracted NFW [60] $r_s = 25.65 \text{ kpc},$ $\rho_s = 4.44 \times 10^7 M_{\odot}/\text{kpc}^3$ $M_{200} = 5.7 \times 10^{11} M_{\odot}$	$\begin{split} \rho_s &= 2.64 \times 10^6 \; M_\odot / {\rm kpc^3} \\ M_{97.2} &= 5.4 \times 10^{11} \; M_\odot \end{split}$	2.0	0.45	10 <sup>-12</sup>	

TABLE I. Summary of the most important parameters of CLUMPY to model the substructure contribution to the total J/D factors in M31 and M33. Note that the virial mass of M33 assuming either an NFW or a Burkert profile has been derived with respect to  $\Delta = 97.2$  times the critical density of the Universe instead of  $\Delta = 200$  as for all other profiles. Moreover,  $r_s$  and  $\rho_s$  of M33's NFW profile have been derived with respect to  $\Delta = 97.2$ , too. The choice of  $\Delta = 97.2$  has been made by the authors of [82,83].

Since Eq. (2) involves a line of sight integral, we also have to consider the DM distribution in the MW when pointing toward M31 or M33. Moreover, it is not possible to exclude a priori that the DM halo of the MW has left no traces in the  $\gamma$ -ray data of Fermi-LAT. Classically, the MW DM halo is fit by either an NFW or a Burkert profile to cover profiles featuring either a central cusp or core. However, the morphological difference between both profiles in the Galactic center is a marginal aspect with respect to the sky position of M31 [(RA, DEC) = $(10.685^\circ, 41.269^\circ)$ ] or M33 [(RA, DEC) =  $(23.462^\circ,$ 30.660°)] so that we choose the NFW profile from [86] as the smooth MW DM halo. Comparing the MW J factor within a circular region of interest (ROI) of radius 1° centered on M31 or M33, the relative difference between a Burkert and an NFW profile is about 15% in both cases. For instance, while the average J factor of M31 from an adiabatically contracted NFW profile inside a circular ROI of 0.4° (corresponding to the spatial extension of M31's  $\gamma$ -ray emission) is about a factor of 100 larger than the respective J factor from the MW NFW halo, the situation reverses not far outside this particular ROI due to the almost perfect isotropy of MW's J factor [cf. Fig. 1(a)]. In another extreme case, namely choosing the same circular ROI of  $0.4^{\circ}$  and centering it on M33, the J factor from M33's DM halo following a Burkert profile is only about 90% of the corresponding J factor due to the MW's DM halo.

We aim to go beyond the zeroth order *J*-factor estimates by accounting for the effect of substructure inside the smooth halos of the MW, M31, and M33. However, quantitative statements about the net effect of the DM substructure

boost are hard to formulate as a precise prediction of the present-day subhalo population properties-e.g., their radial distribution in the host halo or the subhalo survival probability until the present time-of MW-sized galaxies remains an objective of ongoing research. To account for those uncertainties, we define two limiting substructure scenarios (MAX and MIN) that model the expected substructure of the galaxies under study according to the extreme cases still allowed by N-body simulations. Moreover, we also create a benchmark scenario (MED) that features a DM substructure distribution based on the best-fit parameters of recent observations and numerical simulations of structure formation. To this end, we use the public code CLUMPY [87-89] to generate two-dimensional (2D) J-/D-factor sky maps of M31 and M33 as source models for our analysis pipeline as well as MW DM templates as an additional background source.

The parameters governing the substructure distribution in a galaxy that have the largest impact on the expected Jfactors are

- (i) The index  $\alpha_{sub}$  of the subhalo mass function dn/dM which was found to follow a power law [54,55],
- (ii) the fraction of the DM halo mass which is stored in substructure  $f_{sub}$ ,
- (iii) the minimal mass of DM subhalos  $M_{\min}$ , and
- (iv) the subhalo concentration parameter  $c_{200 \text{ sub}}$  [90].

We rely on the most recent model of the concentration parameter of subhalos [85]. We make use of a developer's version of CLUMPYV3 which features this concentration model for extended extragalactic objects. This model reports a flattening of the concentration of subhalos toward the low mass tail of the relation, and, furthermore, it



FIG. 1. Radial profiles of the J/D factors of M31 and M33 derived for annuli of width 0.1° centered on the respective galaxy. In the case of the *J*-factor panels, the solid lines represent the full DM distribution taking into account both the smooth and the substructure DM components (black: MAX; green: MED; blue: MIN), whereas the dash-dotted lines show the respective smooth DM component without subhalos. With dashed lines we display the expected *J*-factor contribution from the MW DM halo in the direction of M31 and M33 which is likewise distinguished in four distinct cases assuming one of the three substructure realizations or a smooth DM component only. The radial *D* factor profiles were derived using the smooth DM halo component stand-alone since the boost to substructure is not expected to yield a sizable enhancement of the  $\gamma$ -ray flux. A detailed list of the chosen DM halo profiles and substructure parameters is given in Table I. The vertical dashed lines in red indicate the spatial extension of the M31  $\gamma$ -ray signal (if applicable) or our analysis ROI, respectively.

includes a dependence on the position of the subhalo within its host halo.<sup>5</sup> Using this description of the subhalo concentration relation implicitly assumes that the DM profiles of subhalos follow an NFW profile which is a fair assumption given the large uncertainty on this quantity as obtained from *N*-body simulations [54–56].

The remaining mutually dependent parameters are chosen to be consistent with the findings of DM-only N-body simulations of MW-sized DM halos. In fact, it has been theoretically established that the minimal subhalo mass  $M_{\min}$  depends on the particle physics nature of DM so that it might cover orders of magnitude down to values like  $10^{-12} M_{\odot}$  [91,92]. In fact,  $M_{\rm min}$  cannot be constrained very well even with astronomical data from current-generation instruments. Natural upper limits on  $M_{\rm min}$  are the masses of dSphs that have already been detected and are resolved in the MW halo. The faintest of them possess masses as low as  $\approx 10^7 M_{\odot}$  [93,94]. From this range, we fix  $M_{\rm min} = 10^6 M_{\odot}$  in the context of the MIN scenario (being very conservative) and  $M_{\rm min} = 10^{-12} M_{\odot}$  with respect to the MAX scenario (being overly optimistic).<sup>6</sup> Our benchmark case MED assumes a typical value of  $M_{\rm min} = 10^{-6} M_{\odot}$  which is often used in the context of a  $\Lambda$ CDM cosmology with cold, thermal WIMP DM [95]. From these values of

<sup>&</sup>lt;sup>5</sup>Neither the release version nor the developer's version of CLUMPYV3 implement the spatial dependence of the subhalo concentration parameter so that this model can only be considered as a slight improvement with respect to the previous parametrization given in [58].

<sup>&</sup>lt;sup>6</sup>CLUMPY restricts the user to at most  $M_{\rm min} = 10^6 M_{\odot}$  for extragalactic objects.

the minimal subhalo mass we can infer the expected fraction of subhalos in a galaxy for a given subhalo mass function index  $\alpha_{sub}$  using the reported behavior found, e.g., in the Aquarius project or the Via Lactea simulation [54,55]. We summarize the definitions of our three substructure scenarios and their assignments to the smooth DM halos in Table I. Those assignments were made in order to bracket the theoretically and observationally allowed J factors from M31 and M33 according to the combination of smooth halo and substructure parameter set.

To complete our model definition, we assume that the radial distribution of subhalos follows the smooth DM density profile of their host halo. As a consequence of this choice, subhalos are expected to populate even the central region of the host DM halo despite the impact of tidal forces and other effects, such as baryonic physics, in this part of the galaxy. Nonetheless, DM-only N-body simulations, e.g., the aforementioned Aquarius and Via Lactea II simulations [54,55], poorly constrain the subhalo population in this particular region [96]. In fact, while certain simulations including baryonic feedback during the galaxy formation process reveal a strong depletion of subhalos in a large volume around the center of a galaxy [97], there are opposing works such as [98,99] arguing that the observed tidal disruption of subhalos is a numerical artifact due to the particle resolution of the simulations. In the context of this ongoing debate, our choice seems as justified as any other.

Having established a full description of our models and substructure parameter sets, we show in Fig. 1 the generated radial profiles of J/D factors. To stress it again, in the case of decaying DM, we only use the here discussed smooth DM profiles since the *D* factor is proportional to the DM density and does not feel the boost due to subhalos.

#### **III. DATA ANALYSIS**

The analysis technique we apply in this paper closely follows those used in the DM searches from dwarf spheroidal galaxies [21,23], Smith High-Velocity Cloud [100], and LMC and SMC [30,31]. In the next sections we describe the data selection and the different steps of the pipeline.

#### A. Data selection

We use 115 months of Fermi-LAT data (from August 4, 2008 to March 4, 2018) selecting Pass 8 SOURCE class events and using the corresponding instrument response functions P8R3\_SOURCE\_V2. We choose an energy range from 300 MeV to 1 TeV and select events with reconstructed directions within a  $16^{\circ} \times 16^{\circ}$  ROI centered at the infrared positions of M31 and M33. We test also different lower bound values (e.g., 100 MeV) for the energy range and different sizes of the ROI to see how the results are affected by these parameters (see Sec. IV B). We bin the data using eight energy bins per decade in energy and 0.08° pixel size.

The Pass 8 event reconstruction and selection called Pass 8 introduces a generalization of the conversion type classification in the form of event types. PSF event types are event-level quantities indicating the quality of the reconstructed direction. The data are divided into quartiles, from the lowest quality quartile (PSF0) to the best quality quartile (PSF3) [101].

We apply zenith angle cuts to the data in order to reduce the contamination from the low-energy Earth limb emission. We select for E = [0.1, 0.3] GeV PSF2 and PSF3 event types with zenith angles  $\theta_z > 90^\circ$ , for E = [0.3, 1.0]PSF1, PSF2, and PSF3 event types with zenith angles larger than  $\theta_z < 100^\circ$ , and finally above 1 GeV we keep all PSF types with zenith angles  $\theta_z > 105^\circ$ . We apply the same cuts used in the construction of FL8Y (and 4FGL; see later in the text) source list; these reduce the contribution of the Earth limb at those zenith angles to less than 10% of the total background. See Table II for a summary of the analysis setup.

We construct a background model of each region that includes the FL8Y sources in the region, as well as an

Selection	Criteria
Observation period	August 4, 2008 to March 4, 2018
Mission elapsed time (s) <sup>a</sup>	239557417 to 541779795
Energy range (GeV)	0.3–1000
Fit region (M31)	$16^{\circ} \times 16^{\circ}$ centered on $(\alpha, \delta) = (10.685^{\circ}, 41.269^{\circ})$
Fit region (M33)	$16^{\circ} \times 16^{\circ}$ centered on $(\alpha, \delta) = (23.462^{\circ}, 30.660^{\circ})$
Zenith range	$\theta_{z} < 90^{\circ}$ and PSF2 and PSF3 for $E \in [0.1, 0.3]$ GeV
	$\theta_z < 100^\circ$ and PSF1, PSF2 and PSF3 for $E \in [0.3, 1.0]$ GeV
	$\theta_z < 105^\circ$ all PSF types for $E > 1$ GeV
Data quality cut <sup>b</sup>	Yes

TABLE II. Summary table of Fermi-LAT data selection criteria used for this paper's DM analysis.

<sup>a</sup>Fermi Mission Elapsed Time is defined as seconds since 2001 January 1, 00:00:00 UTC.

<sup>b</sup>Standard data quality selection: DATA\_QUAL> 1&& LAT\_CONFIG==1 && roicut==yes with the *gtmktime* Science Tool.

interstellar emission model and an isotropic emission template. Very recently, the Fermi-LAT 8-year Point Source Catalog (4FGL) has been created using a new interstellar emission model (IEM) and isotropic templates [102]. The FL8Y and 4FGL catalogs have been created with the same years of data, and no significant differences in the characteristics of the sources present in M31 and M33 ROIs are present. Thus we do not find any relevant difference in our result by using the 4FGL instead of FL8Y (see Sec. IV B). Specifically, we use the IEM released with Pass 8 data [103] (i.e., gll\_iem\_v06.fits) since this is the model routinely used in Pass 8 analyses. We will label this IEM as official (Off). This model is derived by performing a template fitting to Fermi-LAT  $\gamma$ -ray data. It is thus based on the spatial correlations between  $\gamma$ -ray data and a linear combination of gas and inverse Compton scattering maps. This model contains patches to account for extended excess emissions of unknown origin. However, the M31 and M33 regions do not contain any of these patch components. We use for the isotropic emission the template associated with this IEM (iso\_P8R3\_SOURCE\_V2.txt).<sup>7</sup>

To approximately study the systematic uncertainties from the mismodeling of the diffuse emission, we also run our analysis using the eight alternative IEM models and corresponding isotropic templates used in the first Fermi-LAT supernova remnant (SNR) catalog [104]. These models were generated by varying the cosmic-ray (CR) source distribution, height of the CR propagation halo, and HI spin temperature in order to test the effect of the choice of the IEM in the flux and spatial distribution of SNRs. These eight models, which are all based on the GALPROP<sup>8</sup> CR propagation and interaction code, have been used in the SNR catalog to explore the systematic effects on SNRs' fitted properties, including the size and morphology of the extension, caused by IEM modeling. We will label these models as alternatives (Alt).

It is important to stress that the Off and Alt IEMs have been designed to model the diffuse background for analysis of point and small extended sources. Because they are fit to the data, they are not suited for studies of very extended sources and/or large-scale diffuse emissions. Since both M31 and M33 signals are extended at  $\leq$  degree scales, and are not correlated with any other diffuse template, these diffuse models are applicable for our analysis.

In fact, the extended sources studied in the Fermi-LAT SNR catalog [104] have similar spatial extensions as M31 and M33. Finally, we note that the Off IEM and isotropic templates have been routinely used in previous DM analysis from Fermi-LAT. We also stress that if the excess signal would have been found in our ROI with any of these models, then a dedicated diffuse analysis would be required

TABLE III. Summary table for the TS of detection (TS) and extension  $(TS_{EXT})$  in our analysis of Fermi-LAT data in the M31 ROI for the disk (left side) and Gaussian templates (right side) and using in the fit the Off IEM.

	TS	$TS_{\rm EXT}$	$\theta_{\rm EXT}$ [deg]	TS	$TS_{\rm EXT}$	$\theta_{\rm EXT}$ [deg]
Ε		Disk t	template	(	Gaussia	n template
>0.1 GeV	110	15.3	$0.33^\circ\pm0.03^\circ$	109	13.9	$0.41^{\circ} \pm 0.09^{\circ}$
>0.3 GeV	98	13.6	$0.33^\circ\pm0.04^\circ$	97	12.8	$0.42^\circ\pm0.10^\circ$
>0.5 GeV	82	9.6	$0.32^\circ\pm0.04^\circ$	81	8.6	$0.37^\circ\pm0.09^\circ$
>1.0 GeV	58	9.3	$0.31^\circ\pm0.05^\circ$	58	8.2	$0.31^\circ\pm0.09^\circ$

to determine its properties, but it will be shown below that this is not the case here.<sup>9</sup>

We employ FERMIPY to perform our analysis of Fermi-LAT data. FERMIPY is a PYTHON package that automates analyses with the Fermi Science Tools [106].<sup>10,11</sup> We will explain in detail the analysis pipeline in the next sections.

#### **B.** Baseline fit

We first perform a broadband fit to our ROIs using the sources from the catalog, the Off IEM (for the Galactic emission), and isotropic template. The results of this baseline fit (without the DM template) will be used as an input to the DM dedicated analysis described below. The size of the ROI has been taken to be much larger than the DM contribution. Indeed, we see from Fig. 1 that for an angular distance  $>5^{\circ}$  from the center of the ROIs the contribution to the J and D factors are negligible. During the broadband fit the spectral energy distribution (SED) parameters of all the point sources in the ROI, the normalization and spectral index of the IEM, and the normalization of the isotropic templates are free to vary. At this stage in the analysis M31 and M33 are modeled as pointlike sources.

Then, we relocalize all the sources in the ROIs, including M31 and M33. Since we are using more years of data than FL8Y, we identify new sources detected with a test statistic<sup>12</sup> TS > 25. In the last step of the procedure to define the baseline model for the ROI we refine the astrophysical model for M31 and M33. M31 has been detected in [42], using about 7 years of data above

<sup>&</sup>lt;sup>7</sup>For descriptions of these templates, see http://fermi.gsfc.nasa .gov/ssc/data/access/lat/BackgroundModels.html. <sup>8</sup>http://galprop.stanford.edu/

<sup>&</sup>lt;sup>9</sup>This approach is complementary to the recent work [105], in which an almost isotropic emission on the 10° scales from M31, degenerate with the isotropic component of the MW, was studied. In that case a careful modeling of the diffuse emission was necessary and was indeed undertaken in that work.

<sup>&</sup>lt;sup>10</sup>See http://fermipy.readthedocs.io/en/latest/.

<sup>&</sup>lt;sup>11</sup>We use version 17.3 of FERMIPY and 11-07-00 of the Science Tools.

<sup>&</sup>lt;sup>12</sup>The TS is defined as twice the difference in maximum loglikelihood between the null hypothesis (i.e., no source present) and the test hypothesis:  $TS = \hat{2}(\log \mathcal{L}_{test} - \log \mathcal{L}_{null})$  [107].



FIG. 2. *TS* map of M31 (left panel) and M33 (right panel) for  $E \in [0.3, 1000]$  GeV and for a pixel size of 0.08°. The color scale represents values of  $\sqrt{TS}$  in the range between 0 and 5 that for a point source corresponds approximatively to a *TS* between 0 and 25. The bottom (top) panels are *TS* maps where M31 and M33 are included (are not included) in the model. We also display the name and position of sources from the FL8Y catalog included in the model.

100 MeV, as extended with  $TS_{\text{EXT}} = 16$  and size  $0.38^{\circ} \pm 0.05^{\circ}$ . We rerun the extension analysis at E >0.3 GeV finding that  $TS_{\text{EXT}} = 13.6$  and the size (i.e., the 68% containment radius) is  $0.33^{\circ} \pm 0.04^{\circ}$  for a disk template and  $TS_{\text{EXT}} = 12.8$  with a size of  $0.42^{\circ} \pm 0.10^{\circ}$ for a Gaussian template. We also run this analysis for E >0.1/0.5/1 GeV to see if there is an energy dependence of the spatial extension. We report the results for the detection and the spatial morphology of M31 in Table III for the disk and Gaussian spatial templates. The sizes of extension for M31 in the different energy ranges are all compatible within  $1\sigma$ . We significantly detect M31 as extended also at E > 0.1 GeV with a similar size of extension and TS. This justifies our choice of using an extended template that is energy independent. Since the disk morphology is slightly preferred, we use this geometry for M31 as the benchmark case in the rest of our analysis (see Secs. IV E, IV D, and IV C).

M33 is detected as a pointlike source  $(TS_{\text{EXT}} \approx 0)$  with a  $TS = 41.9 \ (TS = 39.4)$  with the analysis performed in the energy range  $E \in [0.1, 1000]$  GeV  $(E \in [0.3, 1000]$  GeV).

Figure 2 shows the *TS* map of the ROI of M31 and M33 without these galaxies included in the model. It is clear from these plots that M31 is much brighter than M33 and that it has an extension of the order of the size detected in our analysis. In the same figure we also show the *TS* map for the baseline model, i.e., with all sources included and with their positions refined. There are no significant residuals in these maps, meaning that the baseline model is an appropriate fit to the two ROIs. The highest *TS* peaks are of the order of  $2 - 3\sigma$  significance. We use this model as a baseline for the search of a DM signal.

TABLE IV. Summary table for the significance of detection and extension in our analysis of Fermi-LAT data in the M31 ROI and M33 ROIs with the Off and Alt IEMs. We assume here a uniform disk spatial template.

	TS	$TS_{\rm EXT}$	$\theta_{\rm EXT}$ [deg]	TS
IEM		M31		M33
Off	110	15.3	$0.33^\circ\pm0.03^\circ$	39
Alt 1	90.1	12.4	$0.32^\circ \pm 0.04^\circ$	42
Alt 2	100	10.2	$0.37^\circ\pm0.06^\circ$	36
Alt 3	89	12.3	$0.32^\circ \pm 0.04^\circ$	42
Alt 4	85	9.8	$0.42^\circ \pm 0.10^\circ$	37
Alt 5	86	12.1	$0.32^\circ \pm 0.04^\circ$	39
Alt 6	94	9.6	$0.36^\circ\pm0.07^\circ$	34
Alt 7	106	11.1	$0.43^\circ \pm 0.07^\circ$	40
Alt 8	84	10.0	$0.32^\circ\pm0.04^\circ$	35

We also run the baseline analysis for M31 and M33 using the eight Alt IEM models and corresponding isotropic templates used in the first Fermi-LAT SNR catalog [104]. Depending on the Alt IEMs, M31 is detected with  $TS \in [84-110]$ ,  $TS_{EXT} \in [9-15]$ , disk size  $\theta_{EXT} =$  $[0.30^{\circ}, 0.45^{\circ}]$ , and Gaussian template size  $\theta_{EXT} \in$  $[0.32^{\circ}, 0.43^{\circ}]$  (see Table IV). In short, no significant changes are found by using different IEMs. Similarly, M33 is detected as a point source with all the IEMs ( $TS_{EXT} \approx 0$ ) with a TS in the range 34–42 (see Table IV).

We test a power-law shape for the SED and also a logparabola (LP) or power law with an exponential cutoff (PLEC). There is no significant preference for the LP or PLEC over the simple power law, so we decide to assume this SED shape in the rest of the paper when we consider the models used in this section.

## C. Baseline fit using astrophysical models from the observations of M31 and M33 in other wavelengths

The baseline fit reported in the previous section, with M31 modeled with a disk template and M33 with a pointlike source, is tuned directly on  $\gamma$ -ray data. It is thus a phenomenological way to explain the  $\gamma$ -ray emission from M31 and M33 without any direct relation with what is observed from these galaxies in other wavelengths.  $\gamma$  rays are produced predominantly by the so-called interstellar emission that is traced by atomic gas density, radio, and infrared emissions. Therefore, we used maps derived from observations in other wavelengths as templates for the astrophysical components of the  $\gamma$ -ray emission from M31 and M33. For M31 we use the Herschel/PACS map at 160  $\mu$ m (which traces the star formation), Spitzer/IRAC map at 3.6  $\mu$ m (that traces old stellar population), and an atomic gas column density  $N_H$  map from [108] (which traces gas densities). On the other hand, for M33 we consider the 2MASS infrared map at 2.2  $\mu$ m, the Spitzer/

TABLE V. Value of the *TS* and difference of likelihood with respect to the disk model ( $\Delta \log L$ ) for M31 and M33 spatial models considered in our analysis. We show the results for the point source, disk, and Gaussian geometrical models and for the templates taken from other wavelengths.

M31		M33			
Model	TS	$\Delta \log L$	Model	TS	$\Delta \log L$
Disk	98	0	Point	41	0
Gauss	97	1	Gauss	41	0
Point	80	5	Optical (3552 A)	41	0
Spitzer $(3.6 \ \mu m)$	94	3	Spitzer (24 µm)	45	-2
Herschel (160 $\mu$ m)	75	9	Spitzer (160 $\mu$ m)	42	0
N <sub>H</sub>	65	18	2MASS (2.2 μm)	41	0

IRAC infrared maps at 24  $\mu$ m and at 160  $\mu$ m, and the Mayall optical map at 3552 A. The analysis used here is the same as in Sec. III B, and we assume for the SED shape of these templates a simple power law. We report the values of the *TS* for the different components in comparison with the results of the point source, disk, and Gaussian templates in Table V.

Among the templates considered for M31, the  $N_H$  map yields the fit with the lowest likelihood and *TS*. Indeed, we see in Fig. 3 that the *TS* map for the case with the  $N_H$ template has more residuals than the one with the Spitzer/ IRAC template. The reason is that the  $N_H$  map traces the disk of M31 that is extended about 3° across the sky while the  $\gamma$ -ray emission detected by Fermi-LAT is concentrated within about 0.4° with a spherical symmetry.

For the same number of degrees of freedom, the Herschel/PACS provides a better fit than the  $N_H$  template. Finally the Spitzer/IRAC map provides the best fit to the data among the templates considered from other wavelengths. The Spitzer/IRAC infrared map is the most similar to those obtained with geometrical models because it is dominated by the bulge component and it is thus similar with what is observed in  $\gamma$ -ray data. Therefore, the  $\gamma$ -ray emission that we detect with Fermi-LAT from the M31 direction is dominated by the bulge emission. Indeed, the stellar bulge of M31 has a total mass of about 3.1  $\times$  $10^{10} M_{\odot}$  and a size of about 5 kpc [84]. The size is perfectly compatible with the extension that we measure in  $\gamma$  rays. Moreover, the M31 stellar bulge is a factor of about 5 more massive than the MW one. These results are compatible with what has been presented in [42].

The astrophysical templates we try for M33 give almost all the same significance which is of the same order of the point source scenario. Indeed, the infrared and optical emission observed from this galaxy have an extension of about  $0.2^{\circ}$  that is of the order of the point source emission. Since the simple point source emission gives the same *TS* as the templates derived from observations in other wavelengths, we use directly this model in the rest of the analysis.



FIG. 3. TS map for the baseline model for M31 with atomic gas column density  $N_H$  map (left panel) and Spitzer/IRAC map (right panel) for  $E \in [0.3, 1000]$  GeV and for a pixel size of 0.08°.

#### D. M31 and M33 DM morphology and correlations with other background sources

As we have seen in the previous sections we detect with Fermi-LAT a  $\gamma$ -ray signal that is well fit with a radial disk of size 0.33° for M31 and with a point source for M33. We have demonstrated that the  $\gamma$ -ray flux in the direction of M31 is compatible with the emission from the stellar bulge while M33 is with infrared and optical maps.

A possible contribution might also come from DM so it is important to understand the Fermi-LAT sensitivity to such a signal. In particular, we are interested in determining the spatial morphology of a putative DM emission (i.e., determine whether it would be detected as pointlike or extended source and in the latter case estimate the size of extension) and calculating the correlations between this component and the other background sources. We use FERMIPY to simulate a DM signal from M31 and M33 DM templates, and we derive its size and spatial morphology. We take the baseline model from Sec. III B, we remove M31 and M33 sources from the model, and we add a DM contribution using the templates reported in Sec. II. We simulate a DM signal that would give a detection at  $9\sigma$ significance with a power-law SED with index 2.0. We use such a simple power-law SED, as we are interested here only in finding the spatial morphology of the DM signal. We show in Fig. 4 the TS map for the  $\gamma$ -ray emission from this DM signal for M31 and M33 for the MED DM model. A very similar TS map is found when using the MIN or the MAX DM model. Then, we fit this excess with an extended source finding that it is well fitted with a Gaussian template with a size of about 0.5° and  $TS_{\text{EXT}} = 30$  for M31 and 0.9° and  $TS_{\text{EXT}} = 25$  for M33. The Gaussian template has about



FIG. 4. *TS* maps for the simulations of a DM signal using the MED DM model from M31 (left panel) and M33 (right panel). The peak of *TS* present in the center of these maps is due to the DM flux.



FIG. 5. DM SED (reported as energy multiplied for the photon flux in each energy bin) for M31 (left panel) and M33 (right panel) for  $E \in [0.3, 1000]$  GeV. We consider here the MED DM model for both sources. The different colors are related to values of the  $\Delta \log \mathcal{L}$  [see Eq. (7)].

the same likelihood value as the disk one. The correlation coefficients between the M31 DM template normalization (spectral index) and the isotropic and IEM template normalizations are -0.07 (-0.14) and -0.23 (-0.12), respectively. Instead, the correlation coefficients between the M33 DM template normalization (spectral index) and the isotropic and IEM template normalizations are -0.04(-0.19) and -0.16 (-0.15), respectively. Therefore, no significant correlations are present between the DM templates of M31 and M33 and IEM and isotropic components. The correlation coefficients between the DM component normalization and the M31 disk normalization is -0.87; instead with the M33 point source SED normalization it is -0.61. Therefore, SED parameters of the M31 and M33 DM templates are correlated with the SED of the disk template for M31 and M33, respectively. We consider these correlations in our analysis as we will explain in Sec. III E. We find similar results using the MIN or MAX DM models.

In the line of sight of M31 and M33 a contribution of  $\gamma$  rays could also come from DM present in the MW. As shown in Fig. 1, the *J* factor for the MW is much smaller than the M31 and M33 components in the inner few degrees from M31. Moreover, the DM MW signal is almost isotropic with a variation of about a factor of 10% across the M31 and M33 ROIs. We test a possible effect of the presence of this additional DM component by taking the simulation done before, which includes the DM M31 component, and adding also the contribution of DM from the MW. We then ran a fit and found that the MW contribution is almost completely absorbed by the isotropic template. Moreover, there is no correlation between the MW and the M31 DM templates. Therefore, we decide in the rest of our analysis to not add this component to the model.

#### E. DM SED and significance

At this stage of the analysis we add to the baseline model, which includes the template for astrophysical emission from M31/M33 (i.e., a disk template for M31 and a pointlike source for M33), the DM template. We run a fit and then compute the likelihood profile as a function of energy and energy flux of DM. We scan in each energy bin the likelihood as a function of the flux normalization for the assumed DM signal which is specified by the choice of decay or annihilation, by the channel, and by the DM mass. In the rest of the paper we will consider the decay and annihilation into  $b\bar{b}$  and  $\tau^+\tau^-$ . The case of  $b\bar{b}$  is representative of hadronic channels such as quarks and gauge bosons while  $\tau^+\tau^-$  represents the leptonic channels  $\mu^+\mu^$ and  $e^+e^-$ . For this bin-by-bin scan, we fix the SED parameters of the sources that have an absolute value of the correlation parameter smaller than 0.10. By analyzing each energy bin separately, we avoid selecting a single spectral shape to span the entire energy range at the expense of introducing additional degrees of freedom into the fit. For the fit in any given bin, the only free parameter describing the DM component is the normalization. In Fig. 5 we report the SED of the DM template for M31 and M33 with the MED model.

In the final step of the fitting procedure we convert the bin-by-bin likelihood curve in flux into a likelihood curve in  $\langle \sigma v \rangle$  for each spatial profile and annihilation or decay channel, which determines the spectrum. We scan DM masses  $(m_{\chi})$  for 5–10000 GeV (when kinematically allowed in the annihilation or decay channel under consideration) and the pair-annihilation or decay final states  $\tau^+\tau^-$  and  $b\bar{b}$ . For each DM spectrum, we extract the expected flux,  $F_j$ , in each energy bin and calculate the likelihood of observing that flux value. The log-likelihood in each energy bin is summed to get the log-likelihood curve, defined as

$$\ln \mathcal{L}(\mu, \theta | \mathcal{D}) = \sum_{j} \ln \mathcal{L}_{j}(\mu, \theta_{j} | \mathcal{D}_{j}),$$
(6)



FIG. 6. Likelihood profile for  $\langle \sigma v \rangle$  as a function of the DM mass for M31 (left panel) and M33 (right panel) for  $E \in [0.3, 1000]$  GeV. These plots are for DM annihilating into  $b\bar{b}$  quarks. The different colors are related to values of the  $\Delta \log \mathcal{L}$ .

where  $\mathcal{L}$  is the likelihood, *j* runs over the energy bins of Fermi-LAT data ( $\mathcal{D}$ ),  $\mu$  are the DM parameters ( $\langle \sigma v \rangle$  or  $\tau$  and  $m_{\chi}$ ), and  $\theta$  are all the other parameters in the background model, i.e., the nuisance parameters.

Therefore, the DM SED has all the information needed to determine whether the presence of DM is significant for any possible DM annihilation channel and mass. Indeed, we can choose a DM annihilation or decay channel and convert the SED into the likelihood profile as a function of the DM  $\langle \sigma v \rangle$  and  $m_{\gamma}$ .

We can also evaluate the significance of the DM hypothesis using the TS defined as

$$TS = 2\Delta \log \mathcal{L} = 2 \ln \frac{\mathcal{L}(\mu, \theta | \mathcal{D})}{\mathcal{L}_{\text{null}}(\theta | \mathcal{D})},$$
(7)

where  $\mathcal{L}_{null}$  is the likelihood for the null signal of DM and  $\mathcal{L}$  is the likelihood for the presence of DM. For the energy bins up to about 10 GeV the statistics are large enough that Chernoff's theorem applies, and we expect the *TS* distribution to follow a  $\chi^2$  distribution [109]. At higher energies, the counts per bin are in the Poisson regime and the  $\chi^2$  distribution moderately overpredicts the number of high *TS* trials observed in simulated data.

From  $\ln \mathcal{L}(\mu, \theta | D)$  we can evaluate the one-sided 95% confidence level (C.L.) exclusion limit on the flux as the point at which the *p* value for a  $\chi^2$  distribution with 1 degree of freedom is 0.05 when we take the maximum likelihood estimate as the null hypothesis. That is, the 95% C.L. upper limit on the flux assigned to DM is the value at which the log-likelihood decreases by 1.35 with respect to its maximum value. An example of this is shown in Fig. 6 for  $b\bar{b}$  annihilation channels for M31 and M33. We will use in Sec. IV the likelihood profile as a function of

DM mass and annihilation cross section, as shown in Fig. 6, or a lifetime to calculate the bounds on  $\langle \sigma v \rangle$  and  $\tau$ .

#### **IV. RESULTS**

In Sec. IVA, we first show a model-independent analysis where we search for an excess in M31 and M33 ROIs without using any DM model. In Sec. IV B we show how the limits on the DM annihilation cross section change by considering a different energy range for the analysis, size of the ROI, assuming different templates for the astrophysical emissions of M31 and M33. Then, in Sec. IV C we use 100 simulations to calculate the expected limits on DM in the null signal hypothesis. In Sec. IV D we assume that all signal comes from DM, and we derive best-fit contours in cross section and mass parameter spaces. As there is no compelling evidence that the emission from these galaxies is solely due to DM and in fact the best fit region is in tension with the DM search from other targets (e.g., dSphs or the Galactic center), in Sec. IV E we set DM limits. We do this for the  $b\bar{b}$  and  $\tau^+\tau^-$  channels and for the MAX, MED, and the MIN DM distributions considered in Sec. II. These channels were previously considered in the dwarf spheroidal analyses [21,23].

#### A. DM model independent search for an excess in M31 and M33 ROIs

As discussed in Sec. II the DM spatial distribution can vary significantly by assuming a MAX, MED, and the MIN model or considering annihilation or decay of DM particles. In addition to this, the DM SED is also uncertain and can vary for the different annihilation or decay channels.

In this section we describe a search for a radial dependent excess by adding to the M31 and M33 ROIs three uniform annuli with radial shapes:  $r \in [0.4^\circ, 3.5^\circ]$ ,  $r \in [3.5^\circ, 6.0^\circ]$ , and  $r \in [6.0^\circ, 8.0^\circ]$ . For this analysis we use a ROI width of



FIG. 7. Left panels: count spectrum of all the components in the model together with the fractional residuals between the data and the best-fit model. Top left panel is for M31 while bottom left is for M33. Right panels: *TS* maps for the fit to M31 (top panels) and M33 (bottom panels) ROIs. In these fits the SED parameters of point sources, the normalization of the isotropic template, and the normalization and slope of the IEM are free to vary. We use here the Off IEM model and correspondent isotropic template.

 $20^{\circ}$  to avoid edge effects in the farthest annulus, and we select an energy range between 0.3–1000 GeV. The analysis pipeline is the same presented for the baseline fit in Sec. III B where we leave free to vary in the fit the SED parameters of point sources, the normalization of the isotropic template, and the normalization and slope of the IEM. We model the emission from M31/M33 with templates described in Sec. III B.

We show in Fig. 7 the count spectrum with the residuals and the *TS* map for this fit to M31 and M33 ROIs using the Off IEM and isotropic templates. The change in normalization of the isotropic template has a best fit value of 1.00 (0.914) while the change of normalization and slope of the IEM are 1.010 (1.048) and -0.03 (-0.02) for M31 (M33). Therefore, for both M31 and M33 the deviation of the isotropic and IEM SED parameters from their input values are minimal.

Now we add to the model the three annuli and we redo the fit. The results are reported in Table VI where we can see that the *TS* for all the three annuli is very small. We run the same analysis for M31 also with the 8 Alt IEMs finding even tighter constraints. The *TS* is  $\approx 0$  for all the three annuli with upper limits for the flux of  $3 - 4 \times 10^{-10}$  ph/cm<sup>2</sup>/s,  $2.5 - 3.5 \times 10^{-10}$  ph/cm<sup>2</sup>/s, and  $2.5 - 3.5 \times 10^{-9}$  ph/cm<sup>2</sup>/s for the first, second annulus, and third annulus, respectively, and depending on the Alt IEM considered.

In Fig. 8 we show the intensity (the flux divided by the solid angle) upper limits found above together with the intensity of the DM contribution for MAX, MED, and MIN

ISO free	Annulus 1	Annulus 1	Annulus 3	Annulus 1	Annulus 1	Annulus 3
TS	0	0	8	0	0	0
Flux [ph/cm <sup>2</sup> /s]	$9.45 \times 10^{-10}$	$4.53 \times 10^{-10}$	$4.62 \times 10^{-9}$	$1.09 \times 10^{-9}$	$9.12 \times 10^{-10}$	$1.91 \times 10^{-9}$
ISO fixed	Annulus 1	Annulus 1	Annulus 3	Annulus 1	Annulus 1	Annulus 3
TS	5	0	20	0	0	0
Flux [ph/cm <sup>2</sup> /s]	$1.82 \times 10^{-9}$	$8.05\times10^{-10}$	$6.56  imes 10^{-9}$	$1.09 \times 10^{-9}$	$1.05 \times 10^{-9}$	$2.41 \times 10^{-9}$

TABLE VI. Summary table for the TS of detection (TS) and flux in our analysis of Fermi-LAT data in the M31 and M33 ROI (in the left and right sides) with three uniform annuli as explained in the text. The top (bottom) part of the table is with the isotropic template free to vary (fixed to the control region).

DM models. We report the case where the DM flux fits the astrophysical contribution from M31 taken as a disk template and M33 as a point source. These DM intensity profiles are in tension with the upper limits for the annuli derived in this section. This analysis shows that if DM contributes entirely to the  $\gamma$ -ray emission from these two galaxies, we should be able to detect a signal also in the outer regions of M31 and M33, i.e., for  $r \ge 2^\circ$ , which would be absorbed by the annuli. These results might change considering different assumptions for the DM distribution in M31 and M33. We also display the DM intensity profiles for the upper limits of the flux reported in Sec. IV E. These contributions are compatible with the upper limits found in this section since they have to be considered as upper limits.

A possible weak point of this analysis is that we are leaving free to vary also the normalization of the isotropic template. If residuals are present in the ROI and their spatial distribution is mostly isotropic, they can be absorbed by the isotropic template. Therefore, we decide to change the analysis made before by fixing the isotropic normalization in the fit to the value found in a control region. We choose the center of the control region to be at the same longitude of the M31 and M33 ROIs but at a latitude 20° below. In this way the contribution of the isotropic is higher, and we are able to constrain effectively its normalization.

We find a best fit value for the isotropic normalization of 0.866 (0.889) for M31 (M33) in the control regions, and we apply these values to the M31 and M33 ROIs fixing this parameter in the fit. Even if we fix in the fit the normalization of the isotropic template, the residuals in the count map are still compatible with 0 in the entire energy range, similar to what is shown in Fig. 7. Also the ROI *TS* maps remain almost unchanged with no significant larger-scale residuals.

The results with the three uniform annuli are reported in Table VI. The *TS* for the annuli is 5 (0) for the inner, 0 (0) for the second, and 20 (0) for the outermost. The upper limits for the flux are slightly larger than in the previous case where we leave the isotropic template free to vary. We run the same analysis for M31 also with the eight Alt IEMs finding even tighter constraints. The *TS* is  $\approx 0$  for the inner



FIG. 8. Intensity upper limits (black data) derived from our analysis in annuli of the M31 (left panel) and M33 (right panel) ROIs. The data point in the inner 0.4° represents the intensity for the astrophysical emission of the sources taken as a disk template for M31 and a point source for M33. The solid lines are the intensity for DM normalized to fit the astrophysical emission of M31 and M33. The dashed lines have been derived from the upper limits for the DM flux derived in Sec. IV E.



FIG. 9. The 95% C.L. upper limits for  $\langle \sigma v \rangle$  as a function of  $m_{\chi}$  for the following cases. The benchmark case reported with a solid black line in these plots is for analysis of data at E > 0.3 GeV, with the Off IEM, with an ROI width  $16^{\circ} \times 16^{\circ}$ , with a disk template for the astrophysical emission, and with an uncertainty of the J factor of  $\log_{10}\sigma_J = 0.2$ . Top left: limits derived for different choices of the lower bound of the analysis: E > 0.3 GeV (black solid line), E > 0.1 GeV (red dashed line), E > 0.5 GeV (blue dot-dashed line), and E > 1 GeV (green dotted line). Top right: limits derived for an ROI width  $16^{\circ} \times 16^{\circ}$  (black line),  $14^{\circ} \times 14^{\circ}$  (red dashed line), and  $20^{\circ} \times 20^{\circ}$  (blue dot-dashed line). Center left: limits derived for different sizes of the disk template: best-fit value (black solid line),  $1\sigma_{\text{EXT}}$ lower (upper bound) with red dashed (green dotted) line, and  $1\sigma_{\text{EXT}}$  lower limit (with blue dot-dashed line). Center right: limits derived for different choices of the astrophysical emission: disk template (black solid line), point source (red dashed line, Herschel/PACS map (green dotted line), Spitzer/IRAC map (blue dotted line), and the atomic gas column density  $N_H$  map (orange dotted line). Bottom left: limits derived for spatially extended DM model with the MED model with  $\log_{10}\sigma_J = 0.2$  (black solid line),  $\log_{10}\sigma_J = 0$  (blue dashed line),  $\log_{10}\sigma_J = 0.35$  (green dotted line) and with a pointlike DM spatial distribution (red dot-dashed line). Bottom right: limits derived with the Alt IEMs used in [104], the newest 4FGL catalog and IEM and isotropic templates [102] and the Off IEM.

two annuli and between 5 and 10 for the outermost with upper limits for the flux of  $5 - 10 \times 10^{-10} \text{ ph/cm}^2/\text{s}$ ,  $4 - 7 \times 10^{-10} \text{ ph/cm}^2/\text{s}$ , and  $3 - 5 \times 10^{-9} \text{ ph/cm}^2/\text{s}$  for the first annulus, second annulus, and third annulus, respectively.

#### **B.** Systematics in the DM results

Different choices in the details of the data analysis can modify at a different extent the results for our DM search. In this section we report the study of the change in the results for the upper limits on  $\langle \sigma v \rangle$  with respect to the lower bound of the energy range and ROI width considered in our analysis, size and model of the astrophysical emission of M31 and M33, prior on *J*, and spatial distribution for the DM component. Other assumptions might change the results by negligible factors. The results are collected in Fig. 9 for M31 (for M33 we find very similar results). The differences are calculated with respect to the baseline setup which is given by the following choices: energy range  $E \in [0.3, 1000]$  GeV, ROI width  $16^{\circ} \times 16^{\circ}$ , disk template with size 0.33°, uncertainty for the *J* factor  $\log_{10}\sigma_J = 0.2$ , and Off IEM.

The choice of the lower bound of the energy range considered in the analysis affects the limits for  $m_{\gamma} >$ 100 GeV as an overall normalization. For these masses, the results for E > 0.1 and > 0.3 GeV differ only by a factor of about 15% with the limits for the former which are better. For  $m_{\gamma} < 100 \text{ GeV}$  the limits found with E >0.1 GeV become larger than the one for E > 0.3 GeV because very small residuals at low energies are absorbed by the DM template. On the other hand, the limits for  $\langle \sigma v \rangle$ derived assuming E > 0.5 and > 1 GeV are worse by factors of about 2 and 3, respectively. Since the limits found with E > 0.3 GeV are the tightest and the PSF and acceptance are much better at 0.3 GeV than at 0.1 GeV, we decide to use this energy range in the rest of the analysis. This choice is also motivated by the fact that the significance for the detection of M31 and M33 and the  $TS_{\text{EXT}}$  is about the same order for E > 0.1 and > 0.3 GeV (see Table III).

We found in Sec. III B that in the baseline model M31 is extended with a size for a uniform disk template of  $0.33^{\circ} \pm 0.04^{\circ}$ . During the search of a DM contribution in our pipeline we do not vary the size of the disk component. We run our search for DM with a size of the disk template modified by  $\pm 1\sigma_{EXT}$  or decreasing it by  $3\sigma_{EXT}$  from the best fit and assuming that  $\sigma_{EXT}$  is the  $1\sigma$ error for the extension size. These changes in the size of the astrophysical emission of M31 affects by a negligible contribution the upper limits for  $\langle \sigma v \rangle$ .

The disk template is a phenomenological model created to fit the  $\gamma$ -ray emission from M31 and is tuned directly on Fermi-LAT data. Employing this geometrical template could hide part of the DM emission. We perform the analysis by substituting the disk template with the following templates motivated by observations of M31 in other wavelengths: the Herschel/PACS map at 160  $\mu$ m, Spitzer/IRAC map at 3.6  $\mu$ m, and the atomic gas column density  $N_H$  map from [108]. The results for the DM search is that we find no evidence for a DM contribution in any annihilation or decay channel, and the upper limits on  $\langle \sigma v \rangle$ are larger for the case with the  $N_H$  (Herschel/PACS) map by a factor of about 2–3 (1.5–2) for  $m_{\gamma} \in [10, 1000]$  GeV. This is due to the fact that by using the  $N_H$  or the Herschel/ PACS templates the TS of the astrophysical component decreases and more residuals remain in the M31 region that are partially absorbed by the DM component (see Fig. 3). On the other hand, the results found with the Spitzer/IRAC template are very similar to the baseline model. Indeed, the TS derived with this infrared map is close to the one obtained with the disk template (see Table V).

Our benchmark DM spatial templates include a spatially extended map with an uncertainty for the J factor that is 0.20 in  $\log_{10}$  units. We test how much the limits for DM change by assuming a pointlike DM template and with  $\log_{10} \sigma_J = 0$  and  $\log_{10} \sigma_J = 0.35$ . These cases embed the uncertainty in the J factor of the main halo of M31 and M33 found by assuming different functions for the DM distribution, which are  $\log_{10}\sigma_J = 0.35$  for M31 and  $\log_{10}\sigma_I = 0.25$  for M33 [83,84]. The upper limits decrease (increase) by a factor of about 15% (25%) using  $\log_{10} \sigma_I = 0$  ( $\log_{10} \sigma_I = 0.35$ ). These differences are subdominant with respect to the ones reported above (e.g., the spatial template for M31). Changing the DM template into a pointlike morphology strengthens the limits by a maximum of a factor of about 8 for  $m_{\gamma} > 300$  GeV and of a factor of about 4 for  $m_{\gamma} \sim 10$  GeV. However, we know that a pointlike DM template is not physically motivated for such close galaxies. Choosing  $\log_{10}\sigma_I = 0$  decreases the limits by a normalization factor of the order of 15%.

Moreover, changing the ROI width to  $14^{\circ} \times 14^{\circ}$  or  $20^{\circ} \times 20^{\circ}$  changes by a negligible amount the limits for  $m_{\chi} > 100$  GeV while at smaller masses the choice of a smaller ROI width can give significantly larger limits because of residuals generated by edging effects that are absorbed as a DM signal at low energy.

Finally, we run the analysis with the Off, the Alt IEMs, and by using the newest 4FGL catalog and IEM and isotropic templates [102]. The results change by at most 30% between the Off and Alt IEMs while the 4FGL gives a difference of at most 50% at  $m_{\chi} = 200$  GeV. Even if the limits with the 4FGL catalog are higher than the other cases the significance for the presence of DM is still negligible.

Similar conclusions are also valid for the  $\tau^+\tau^-$  annihilation channel and for the decay case.

#### C. Null and injected signal simulations

The pipeline that we employ in this paper can also be used to perform simulations. In particular, simulations are generated by FERMIPY that take the source model and



FIG. 10. Results for 100 simulations of the null signal (see the text for further details). Upper limits for  $\langle \sigma v \rangle$  for M31 (left panel) and M33 (right panel) for the  $b\bar{b}$  annihilation channel and for the MED DM model. The median (red dashed line) and the 95% (yellow band) and 68% (green band) containment bands over the 100 simulations are shown. The canonical thermal relic cross section is also reported [6] (grey dot-dashed line).

randomize it with Poisson statistics. This method is much faster than the tool GTOBSSIM which is included in the FERMITOOLS,<sup>13</sup> and it is usually used for the same scope. We consider here two types of simulations to validate our analysis pipeline: null and injected signal simulations.

Null simulations are made by taking the model from the baseline fit, i.e., without the DM contribution, and simulating the ROI. Then we run the search for DM on the simulated data. The goal of these simulations is to calculate the expected limits in the absence of any DM signal. We run the null signal simulations on both M31 and M33 for the bb and  $\tau^+\tau^-$  channels and for MIN, MED, and MAX DM models. We show in Fig. 10 the upper limits for  $\langle \sigma v \rangle$  that we derive for 100 simulations of the null signal for M31 and M33. This is done for the  $b\bar{b}$  annihilation channel and for the MED model. The plots show the median upper limits and the 95% and 68% containment bands over the 100 simulations. As expected, the search for DM with these simulations gives  $TS \sim 0$ . Therefore, we show the results in the form of upper limits for  $\langle \sigma v \rangle$ . The median is well contained in the 68% containment bands, and the limits rule out the thermal cross section for  $m_{\gamma} < 50$  GeV for M31 and  $m_{\gamma} < 20$  GeV for M33.

On the other hand, for the injected signal simulations a DM signal for a specific annihilation channel, cross section, and mass is added to the model. Then, FERMIPY generates the simulated data, which are analyzed in the same way as the actual data. We perform these simulations to verify that our pipeline is able to recover an injected signal. We choose

to inject in the M31 ROI a DM signal with  $m_{\chi} = 100$  GeV, with  $\langle \sigma v \rangle = 10^{-25}$  cm<sup>2</sup>/s, and for an annihilation channel  $b\bar{b}$ . We run 100 simulations and we use the MED DM distribution. This signal can be detected at most with a *TS* of 15. The contour plot for the cross section and DM mass is reported for this simulation in Fig. 10. The best fit cross section and DM mass is perfectly compatible with the characteristics of the injected signal. Since the *TS* for detection is below 25, we decide to calculate upper limits for each simulation. In Fig. 11 we show the median and the 95% and 68% containment bands over the 100 simulations. These limits are consistent with the cross section of the injected signal demonstrating once again that our pipeline is able to recover an injected DM signal.

#### **D. DM-only interpretation**

In this section we make the assumption that the  $\gamma$ -ray emission in the direction of M31 and M33 is entirely given by DM particle interactions. In order to do so, we remove from the source model the astrophysical model for the  $\gamma$ -ray emission from M31 and M33, we include the DM template, and we run the pipeline described in Sec. III.

Tables VII and VIII contain the best fit and  $1\sigma$  errors for the DM mass and cross section for the  $b\bar{b}$  annihilation channel and for M31 and M33, respectively. We report these results using only the main DM halo (SH) or including also DM substructures (SHS), and for each of these cases we try the MIN, MED, and MAX models for the DM distribution.

We first focus on the results found for M31. The *TS* for the presence of DM for the  $b\bar{b}$  annihilation channel, is 27 for the MED DM model in the SHS case and 55 for the

<sup>&</sup>lt;sup>13</sup>https://fermi.gsfc.nasa.gov/ssc/data/analysis/scitools/help/ gtobssim.txt



FIG. 11. Results of the analysis of 100 simulations with an injected signal in the M31 ROI with  $m_{\chi} = 100$  GeV, with  $\langle \sigma v \rangle = 10^{-25}$  cm<sup>3</sup>/s, for an annihilation channel  $b\bar{b}$ , and for the MED DM model. Left panel: contour plot for  $m_{\chi}$  and  $\langle \sigma v \rangle$ . The color bar represents the *TS* for the signal. Right panel: upper limits for  $\langle \sigma v \rangle$  as a function of the DM mass. The median (red dashed line) and the 95% (yellow band) and 68% (green band) containment bands over the 100 simulations are shown.

Einasto profile in the case of SH. This DM candidate has a mass of 30 (20) GeV and a cross section of  $3.2 \times 10^{-26}$  cm<sup>2</sup>/s ( $5.2 \times 10^{-26}$  cm<sup>2</sup>/s) for the SHS (SH) case. The MIN and MAX DM distributions for SHS and the Burkert and adiabatic for the SH case provide similar significances and DM masses but larger and lower values for the best-fit cross sections. On the other hand, for the  $\tau^+\tau^-$  annihilation channel the best fit mass is at the lower limit of the DM mass considered in our analysis, i.e., 5 GeV, and a cross section of about  $1.5 \times 10^{-26}$  cm<sup>3</sup>/s for the MED model. The decay scenario provides a very low significance for the Burkert and Einasto DM profiles and both  $b\bar{b}$  and  $\tau^+\tau^-$  channels with *TS* values of the order of 5–8. The only case that provides a large significance is with the adiabatic DM profile for which in the  $b\bar{b}$  channel the best fit is  $m_{\chi} = 30$  GeV and  $\tau = 6.5 \times 10^{24}$  s for TS = 21while for the  $\tau^+\tau^-$  channel  $m_{\chi} \leq 5$  GeV and  $\tau \leq 9.9 \times 10^{24}$  s for TS = 20. Only the adiabatic DM profile provides a high significance because its spatial profile is similar to the  $\gamma$ -ray signal. On the other hand, the Burkert and Einasto models have a spatial distribution that is much broader (see Fig. 1).

TABLE VII. Summary table for the *TS*,  $m_{\chi}$ , and  $\langle \sigma v \rangle$  of DM in M31 ROI considering the SHS (left side) or SH case (right side). We assume here a  $b\bar{b}$  annihilation channel.

SHS				SH				
DM model	$m_{\chi}$	$\langle \sigma v \rangle$	TS	DM model	$m_{\chi}$	$\langle \sigma v \rangle$	TS	
MIN	$25^{+40}_{-15}$	$1.3^{+2.2}_{-0.6} \times 10^{-25}$	27	Burkert	$20^{+10}_{-5}$	$1.4^{+1.0}_{-0.3} \times 10^{-25}$	43	
MED	$30^{+35}_{-15}$	$3.2^{+4.1}_{-1.7} \times 10^{-26}$	27	Einasto	$20^{+10}_{-5}$	$5.2^{+2.9}_{-1.1} \times 10^{-26}$	55	
MAX	$40_{-20}^{+60}$	$1.1^{+2.4}_{-0.6} \times 10^{-26}$	20	Adiabatic	$20_{-5}^{+10}$	$2.0^{+1.2}_{-0.5} \times 10^{-26}$	56	

TABLE VIII.	Same as	Table	VII	but	tor	M33.
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SHS				SH				
DM model	$m_{\chi}$	$\langle \sigma v \rangle$	TS	DM model	$m_{\chi}$	$\langle \sigma v \rangle$	TS	
MIN	$20^{+50}_{-10}$	$5^{+8}_{-3} \times 10^{-24}$	23	Burkert	$50^{+60}_{-30}$	$2.6^{+3.3}_{-1.8} \times 10^{-24}$	25	
MED	$30_{-20}^{+60}$	$9^{+16}_{-7} \times 10^{-25}$	18	Einasto	$90_{-60}^{+110}$	$2.3^{+2.8}_{-1.6} \times 10^{-24}$	31	
MAX	$25^{+45}_{-20}$	$7^{+20}_{-5}  imes 10^{-27}$	13		00	1.0		



FIG. 12. *TS* for the presence of DM ( $2\Delta \log L$ ) as a function of DM mass and cross section for  $b\bar{b}$  annihilation channel and MED DM model for M31 (left panel) and M33 (right panel). We also display the upper limits for  $\langle \sigma v \rangle$  derived for dwarf spheroidal galaxies in [110].

The results for M33 for the DM annihilating into  $b\bar{b}$  for the MIN, MED, and MAX models in the case of SHS and for Einasto and Burkert DM profiles for the SH scenario are reported in Table VIII. The significance for the presence of DM for the  $b\bar{b}$  annihilation channel, considering the MED DM model, is 18 for the SHS case and 31 for the Einasto profile in the SH scenario. This DM candidate has a mass of 30 (20) GeV and a cross section of  $9 \times 10^{-25}$  cm<sup>2</sup>/s  $(2.3 \times 10^{-24} \text{ cm}^2/\text{s})$  for the SHS (SH) case. The MIN and MAX DM distributions provide similar significances and DM masses but larger and lower values for the best-fit cross sections. The decay scenario with  $b\bar{b}$  channel provides TS values of the order of 12 for the Einasto and 16 for the Burkert profile with  $m_{\chi} = 15$  GeV and  $\tau = 1.3 \times 10^{25}$ . On the other hand, the  $\tau^+ \tau^-$  channel gives TS values of the order of 11 for the Einasto and 14 for the Burkert profile with  $m_{\gamma} \leq 5$  GeV and  $\tau \leq 2.1 \times 10^{25}$ .

The DM candidates for either  $b\bar{b}$  and  $\tau^+\tau^-$  annihilation channels are in strong tension with limits found from dwarf spheroidal galaxies [110] (see Fig. 12). This tension is present for the MIN and MED DM models while it is alleviated for the MAX DM distribution.

#### E. DM plus astrophysical emission interpretation

In this section we make the more realistic assumption that in addition to a putative DM signal there is also an astrophysical contribution from the galaxy itself. We use the astrophysical emission from M31 and M33 as given in the model found with the baseline fit, thus using an extended source with a disk template with size 0.33° for M31 and a point source for M33. Moreover, we include in the analysis the correlations between the SED parameters of DM with the ones of M31 and M33 and the other background sources (see, e.g., Sec. III). We do not find any significant emission when we include the astrophysical contribution of M31 and M33. Indeed, the *TS* for the presence of DM is very close to 0 for both annihilation and decay and  $b\bar{b}$  and  $\tau^+\tau^-$  channels.

The disk template for M31 is a phenomenological model tuned directly on  $\gamma$ -ray data and can hide a possible DM contribution. Therefore, we calculate the DM *TS* also with the following templates: the Herschel/PACS map at 160  $\mu$ m, the Spitzer/IRAC map at 3.6  $\mu$ m, and the atomic gas column density  $N_H$  map from [108].

We find no evidence for a DM contribution since the *TS* is at most of a few considering all the annihilation or decay channels.

We therefore set upper limits on the annihilation cross section  $\langle \sigma v \rangle$  or lower limits for the lifetime  $\tau$ .

In Figs. 13 and 14 we show the upper limits for the annihilation cross section  $\langle \sigma v \rangle$ , and in Fig. 15 we show the lower limit for the lifetime  $\tau$ . Together with the observed limits we also report the expected limits in case there is no signal (see Sec. IV C). First of all we note that the observed limits for the DM annihilation scenarios are in all cases included in the 95% containment bands. For M33 the observed limits are systematically larger than the median expected limits from the null simulations but since for all DM scenarios they are included in the 95% containment band, this difference is not significant. Second, the limits derived with the MAX DM distribution model are the strongest for both M31 and M33. This is expected because the J factor for this model is higher than the MED and MIN models. In the case of the MED DM model the limits found for M31 constrain the thermal cross section up to about 50 GeV while in the case of M33 only the MAX DM model is able to reach the thermal cross section. In the case of decay of DM particles all the limits are well included in the 95% containment bands except for M31 and the case with



FIG. 13. Upper limits for the annihilation cross section of DM for M31. On the left (right) side we show the limits for the  $b\bar{b}$  ( $\tau^+\tau^-$ ) annihilation channel. The first/second/third row is for the MIN/MED/MAX DM distribution model. The horizontal dashed line shows the canonical thermal relic cross section [6].

the  $b\bar{b}$  channel. This is probably due to a local fluctuation present in the observed limits that is not seen in the simulations but the discrepancy is not significant.

These are the limits found using our benchmark case for the data analysis (energy range and ROI width), astrophysical template for M31 and M33 (disk template for M31



FIG. 14. Same as Fig. 13 but for M33.

and point source for M33), IEM, and isotropic templates. The limits slightly change assuming a different choice for the above cited parameters and models, and we reported in Sec. IV B the magnitude of these changes.

### **V. DISCUSSION AND CONCLUSIONS**

We performed a systematic study of the  $\gamma$ -ray emission from M31 and M33 galaxies with a particular focus on a possible DM contribution. We first used our analysis to find



FIG. 15. Lower limits for the DM lifetime for M31 (top panel) and M33 (bottom panel). On the left (right) side we show the limits for the  $b\bar{b}$  ( $\tau^+\tau^-$ ) decay channel. These results have been derived with the MED DM distribution model.

the best geometrical model that explains the  $\gamma$ -ray flux from these sources. For M31 the best model is a uniform disk with a size 0.33° and  $TS_{\text{EXT}} = 13$  while for M33 it is a pointlike source.

We also fit  $\gamma$ -ray emission with templates derived from other wavelengths: (far-)infrared and gas column density maps. These templates provide worse fits for M31 and M33, with respect to data-driven templates, leaving more residuals in the model. The templates that best explain the data are infrared maps that trace the emission from the stellar bulge, meaning that most of the  $\gamma$ -ray flux that we observe probably comes from this component.

If we interpret the flux from M31 and M33 using only DM, we have DM candidates with a mass around 20– 50 GeV and a cross section that is close to the thermal one for M31 and is around  $10^{-25}$  cm<sup>2</sup>/s for M33 and the MED DM model. All the DM candidates found with the MED and MIN DM models and for  $b\bar{b}$  and  $\tau^+\tau^-$  annihilation and decay channels are ruled out by the current limits found from the MW dwarf spheroidal galaxies [110].

Finally we made the more realistic assumption that the flux from M31 and M33 comes at least partially from the galaxy. We use in this case the disk template for M31 and the point source morphology for M33 or the templates from infrared or hydrogen gas column densities for M31. We do not find any excess for the presence of DM for all these cases so we put limits on the annihilation cross section or the lifetime that for the MAX and MED DM models constrain the thermal cross section up to 200 GeV and 70 GeV (50 GeV and 10 GeV) for M31 (M33), respectively.

In Fig. 16, we compare our results with different limits set by other studies for the  $b\bar{b}$  channel. We see that the MED DM model is able to constrain the DM interpretation of the GC excess and that our limits for M31 are similar to the ones derived with dwarf spheroidal galaxies up to about 1 TeV.



FIG. 16. Comparison between the 95% C.L. upper limits from M31 (black solid line) and M33 (blue solid line) presented in this paper with the limits found from dwarf spheroidal galaxies [21] (red dashed line). We also show the confidence regions for cross section and mass determined by analyses of the Galactic center excess [15,16,111,112]. The M31 and M33 upper limits are based on the MED DM model (see Sec. II). The horizontal dashed line shows the thermal relic cross section [6].

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