Investigating the detection of dark matter subhalos as extended sources with Fermi-LAT

Mattia Di Mauro $\mathbb{R}^{1,2,*}$ $\mathbb{R}^{1,2,*}$ $\mathbb{R}^{1,2,*}$ Martin Stref $\mathbb{R}^{3,†}$ $\mathbb{R}^{3,†}$ $\mathbb{R}^{3,†}$ and Francesca Calore $\mathbb{R}^{3,‡}$ $\mathbb{R}^{3,‡}$ $\mathbb{R}^{3,‡}$ $\mathbb{R}^{3,‡}$ $\mathbb{R}^{3,‡}$

¹NASA Goddard Space Flight Center, Greenbelt, Maryland 20771, USA
²The Catholic University of America, Department of Physics, Washington D.C. 20

 2 The Catholic University of America, Department of Physics, Washington D.C. 20064, USA

 3 Université Grenoble Alpes, USMB, CNRS, LAPTh, F-74000 Annecy, France

 \circ (Received 27 July 2020; accepted 15 October 2020; published 9 November 2020)

Cold dark matter (DM) models for structure formation predict that DM subhalos are present in the Galaxy. In the standard paradigm of DM as weakly interacting massive particle, subhalos are expected to shine in gamma rays and to provide a signal detectable with current instruments, notably with the Large Area Telescope (LAT) aboard the *Fermi* satellite. This is the main motivation behind searches for DM signals towards dwarf spheroidal galaxies and unidentified Fermi-LAT sources. A significant angular extension detected from unassociated sources located at relatively high latitudes is considered a "smoking gun" signature for identifying DM subhalos. In the present work, we systematically explore, by means of state-of-the-art models of cold DM halos in the Galaxy, the detectability of extended subhalos with Fermi-LAT. We simulate a DM signal exploring different assumptions of subhalos distribution in the Galaxy and DM profile, and reconstruct its flux through a realistic Fermi-LAT analysis pipeline. In the most optimistic case, we show that a detection of extended DM subhalos can be made for annihilation cross sections higher than 3×10^{-26} cm³/s (for a 100 GeV DM mass), still compatible with existing gamma-ray constraints, and that, in this case, the preference for extension of the source (vs a pointlike hypothesis) is significant. For fainter signals, instead, halos not only do not show significant extension, but they are not even detectable significantly as pointlike sources.

DOI: [10.1103/PhysRevD.102.103010](https://doi.org/10.1103/PhysRevD.102.103010)

I. INTRODUCTION

Unveiling the nature of dark matter (DM) remains one of the major challenges for particle physics and cosmology. Despite the achievements on the theoretical and experimental side, the standard paradigm of DM being made of weakly interacting massive particles (WIMP) [\[1\]](#page-11-0) is challenged by null results of detection of these elusive particles with current experiments. In particular, indirect detection of DM signals with high-energy photons strongly constrains the WIMP DM parameter space [\[2\]](#page-11-1).

Since they are expected to have a low astrophysical background and are predicted to be dynamically dominated by DM, dwarf spheroidal galaxies represent promising targets for DM identification [\[3\]](#page-11-2). Besides, DM halos that cannot form stars are predicted to exist in cold DM scenarios of structure formation. While such objects are "dark" for optical telescopes, gamma-ray instruments may unveil DM signals emitted therein. Searches for DM in subhalos, either in the faintest detectable dwarf galaxies or in their "dark halos" counterparts, represent a powerful test for the WIMP paradigm.

Typically, searches towards known dwarf galaxies, as well as searches for DM subhalos have been performed under the assumption that the emitted DM signal is pointlike (with respect to the angular resolution of the instrument). Both data-driven, e.g., [\[4,5\],](#page-11-3) and template-based, e.g., [\[6\],](#page-11-4) searches towards known dwarf spheroidal galaxies look for excess(es) of photons above the atrophysical background, compatible with pointlike DM signal(s) from the dwarf(s) direction(s). Analogously, most of the sensitivity predictions for DM subhalo detectability [\[7](#page-11-5)–9], as well as searches for DM subhalos in unidentified sources [\[10,11\]](#page-11-6), treat DM subhalos as pointlike objects.

Nevertheless, DM subhalos may have a significant angular extension in the sky, depending on their position and mass profile. The detection of angular extension of unidentified high-energy gamma-ray sources located at latitudes $|b| > 20^\circ$ has been advocated to be a "smoking" gun" signature of DM subhalos [\[12\]](#page-11-7), and it has recently received more and more attention in the literature. In particular, analyses of angular extension of unidentified sources detected by the Large Area Telescope (LAT), aboard the Fermi satellite, were performed without much success: No extended halo was found (or finally confirmed) around Fermi-LAT unidentified sources [\[10,13](#page-11-6)–15]. Also a complementary approach, looking for optical counterparts

[^{*}](#page-0-3) dimauro.mattia@gmail.com

[[†]](#page-0-3) stref@lapth.cnrs.fr

[[‡]](#page-0-3) calore@lapth.cnrs.fr

of Fermi-LAT extended and unidentified sources in GAIA data, gave null results [\[16\].](#page-11-8) Also, recent sensitivity predictions for DM subhalo identification with future gamma-ray instruments included a spatial analysis of DM halos [\[17,18\]](#page-11-9).

Although searches for extension in real data have been carried out, to the best of our knowledge there is a lack of a complete analysis of the detectability of angular extension of DM subhalos. It is not clear, for example, if the Fermi-LAT has the capability of detecting subhalos as extended and, if yes, for which DM particle physics parameters (notably, the annihilation cross section)—there is indeed no a priori reason why the Fermi-LAT sensitivity to DM extended subhalos should be the same as for pointlike subhalos, as for example derived in [\[7\].](#page-11-5) In the present work, for the first time we address this issue and quantify what is the impact of modeling DM subhalos as fully extended objects. To this end, we rely on semianalytical models for the distribution and statistics of DM subhalos in the Galaxy, which account for Milky Way dynamical constraints and include tidal effects which the subhalos are subject to when moving in the Galactic gravitational potential [\[19\]](#page-11-10). Such models do not distinguish between "dark subhalos" and optically detectable ones (i.e., dwarf galaxies), since they do not implement any recipe for galaxy formation. In what follows, we therefore indicate as "subhalo" every DM substructure present in the Galaxy. Our final goal is to quantify the sensitivity of Fermi-LAT to the brightest extended DM subhalo, and, ultimately, understand how to use cold DM predictions to identify DM subhalo candidates in unidentified sources exploiting angular information. Since we make use of simulated data we do not investigate how a possible mismodeling of the interstellar emission affects the results. This is an important issue to address, especially in real data analysis, and it will be discussed in a forthcoming paper.

In Sec. [II,](#page-1-0) we describe models and statistics of the Galactic subhalo population. In particular, we stress the importance of a correlation between intensity of the predicted DM signal and angular extension of DM sub-halos. In Sec. [III A,](#page-4-0) we illustrate the setup to simulate Fermi-LAT data and the analysis detection pipeline we follow. We present our results in Sec. [IV](#page-6-0) and conclude in Sec. [V.](#page-9-0)

II. SUBHALO MODELS AND STATISTICS

In this section, we describe the DM subhalo population models we use, as well as the mock subhalo catalogs generated from these models.

A. The subhalo models

Our analysis is based on the semianalytical subhalo model developed by Stref and Lavalle [\[19\]](#page-11-10) which is referred to as SL17 from now on. SL17 is built upon the realistic Milky Way mass model developed by McMillan [\[20\]](#page-11-11) in which the Galactic dark halo is assumed to have a Navarro-Frenk-White (NFW) [\[21\]](#page-11-12) density profile shape. Cold DM subhalos are expected to have cuspy density profiles, and the profile shape can be chosen freely in the model. In the following we consider either NFW subhalos or Einasto subhalos (with $\alpha_{\text{Ein}} = 0.16$ based on [\[22\]](#page-11-13)). Subhalos are subject to tidal effects as they orbit in the gravitational potential of the Galaxy and its DM halo. Two distinct effects are accounted for in SL17: The tidal mass loss due to the smooth gravitational potential of the Galaxy, and the effect of gravitational shocking experienced by a subhalo crossing the Galactic stellar disk. Both these effects strongly impact the subhalo population by stripping off mass from these objects, sometimes destroying them completely. The efficiency of this destruction is still a matter of debate. Studies based on cosmological simulations find that subhalos are efficiently disrupted in the inner parts of the Galaxy [\[23,24\].](#page-11-14) On the other hand, recent semianalytical studies find that cuspy subhalos such as those predicted by cold DM are very resilient to tides and can survive considerable mass losses [\[25,26\].](#page-11-15) Also, the disruption observed in cosmological simulations could be due to numerical artifacts [\[27\]](#page-11-16). Whether subhalos can be disrupted or not has consequences on predictions for DM searches, in particular indirect searches for self-annihilating DM because the annihilation rate is very high in cuspy subhalos [\[28\]](#page-11-17). In the present work, we remain agnostic about the resilience of subhalos to tides and treat it as a theoretical uncertainty for our predictions. We bracket this uncertainty by considering two extreme configurations of the SL17 model. The "SL17-fragile" configuration corresponds to what is commonly observed in cosmological simulations; *i.e.*, subhalos are efficiently disrupted by tides. In the "SL17-resilient" configuration, on the other hand, subhalos can lose most of their mass but the central cusp almost always survives. More precisely, in the SL17-fragile configuration it is assumed that a subhalo is disrupted as soon as its tidal radius is smaller than its scale radius $r_t \le r_s$. In the SL17-resilient configuration, on the other hand, disruption only takes place if $r_t \leq 0.01r_s$. These configurations were originally defined in [\[28\]](#page-11-17) which we refer the reader to for additional details.

B. The subhalo mock population

The SL17 model gives a statistical description of the Galactic subhalo population. More precisely, it provides a recipe to compute the probability distribution function (PDF) of various subhalo parameters (mass m_{200} , concentration c_{200} and position). This model is fully implemented in the CLUMPY public code [29–[31\],](#page-11-18) which can be used to generate mock subhalo population catalogs starting from these parameters' PDFs. Each of these catalogs is therefore a realization of the Galactic subhalo population based on the SL17 model. CLUMPY also computes the J-factor of

FIG. 1. Upper panel: Correlation between J-factor and total angular size on the sky for subhalos in two different models (only one realization for each model is shown). Lower panel: J-factor PDF of the brightest subhalo, J_{tot}^{\star} .

each subhalo, i.e., the integral along the line of sight (l.o.s.) of the DM density squared,

$$
J(\Delta\Omega) = \int_0^{\Delta\Omega} \int_{\text{l.o.s.}} \rho_{\text{DM}}^2 \, \text{d}l \, \text{d}\Omega,\tag{1}
$$

where ρ_{DM} is the subhalo mass density, and $\Delta\Omega = 2\pi(1$ $cos(\theta)$ is the solid angle for a viewing angle θ . The J-factor appears in the expression of the gamma-ray flux produced by DM annihilation. The total J-factor, i.e., the J-factor integrated up to the full angular extension of a subhalo (i.e., its tidal radius), is labeled as J_{tot} .

For a subhalo of radius R and at a distance d from the observer, we define the total angular size as $\theta_{\text{tot}} \equiv \arcsin(R/d)$. The angular size of a DM subhalo is therefore a geometric consequence of the subhalo mass profile and its distance. In the top panel of Fig. [1](#page-2-0), we show that, in the subhalo catalogs, there exists a correlation between the subhalo J_{tot} and its total angular size on the sky; see also [\[10\]](#page-11-6). While we are not interested in parametrizing such a correlation nor we directly use it in the following, we can generally conclude that subhalos with the highest J-factors also show a significant angular extension of up to a few degrees. This suggests that the DM subhalos with the highest gamma-ray flux could be detected as extended sources rather than pointlike objects. Previous works have mostly focused on the analysis of DM subhalo detectability in the case of pointlike sources. However, if the brightest subhalo is indeed extended in the sky—as the correlation suggests—the Fermi-LAT sensitivity to subhalos may be different. Here, we aim at quantifying whether or not a search for extended sources improves detection prospects. To do so, we consider the distribution of the brightest subhalo, i.e., the subhalo with the highest *J*-factor, J_{tot}^{\star} .

We generate 1010 mock population catalogs for each of the two model configurations, SL17-fragile and SL17 resilient. We perform a latitude cut in the catalogs, discarding all subhalos with $|b| < 10^{\circ}$ (rejecting on average 17% of subhalos with $j > 10^{17}$ GeV²/cm⁵), and identify, in each Monte Carlo realization, the subhalo with the highest J-factor among the remaining ones—and so only one subhalo for each Monte Carlo realization. We then compute the PDF of the J-factor of the brightest halo for both configurations and show the result in the bottom panel of Fig. [1.](#page-2-0) If subhalos have a NFW profile, the SL17-fragile PDF peaks around $J_{\text{tot}}^* \sim 2.5 \times 10^{19} \text{ GeV}^2/\text{cm}^5$ while the SL17-resilient PDF peaks at $J_{\text{tot}}^* \sim 10^{20} \text{ GeV}^2/\text{cm}^5$. The lower J_{tot}^* in the SL17-fragile case compared to the SL17resilient case comes mainly from the distance to the brightest object. The stellar disk is very efficient at stripping mass from subhalos. While this is fatal to most clumps passing through the disk in the SL17-fragile scenario, in the SL17-resilient case subhalos can still survive and remain close to the Solar System. If subhalos have an Einasto profile, the J-factors increase by a factor of roughly $1.6¹$

We also compute the PDF of the angular size associated to the brightest subhalos. The PDF of $\theta_{\text{tot}}^{\star}$, i.e., of the total angular size of the brightest subhalo in each simulation, is shown on the top panel of Fig. [2](#page-3-0). In the SL17-fragile case, the brightest subhalo typically has $\theta_{\text{tot}}^* \sim 2^{\circ}$ and the PDF is rather narrow, while $\theta_{\text{tot}}^* \sim 3^\circ$ for the SL17-resilient model and the PDF is much broader. Note that the choice of profile, NFW or Einasto, does not affect significantly neither the subhalo's radial extension nor its position. The PDF value of $\theta_{\text{tot}}^{\star}$ is thus the same regardless of the density profile shape. On the bottom panel in Fig. [2](#page-3-0), we show the PDF of θ_{68}^* which is defined with respect to the radius enclosing 68% of the total J-factor. For both subhalo

¹Note that we did not generate subhalo catalogs for the Einasto profile case. Instead we only generate catalogs for the NFW case, find the brightest subhalo in each catalog and extract its parameters (mass m_{200} , concentration c_{200} and position), then compute the J-factor that would have a subhalo with an Einasto profile with identical parameters.

FIG. 2. Upper panel: PDF of the total angular size of the brightest subhalo, θ_{tot}^* . Lower panel: Same as the upper panel for the angle containing 68% of the total J-factor, θ_{68}^* .

models, the PDF is centered on values smaller than 1°. This is what is expected when computing the radius enclosing 68% of the total J-factor. For an NFW subhalo with tidal radius $r_t \gg r_s$, we have $\theta_{68} \simeq \arcsin(r_s/(2d))$. For a 10^7 M_o subhalo at a distance of 10 kpc, this is $\theta_{68} \simeq 0.7^{\circ}$. For the NFW density profile, θ_{68}^{\star} is 0.74° and 0.56° for the SL17-resilient and SL17-fragile models, respectively. The slightly larger extension of SL17-resilient subhalos compared to SL17-fragile ones is, like their higher J-factor, due to their proximity and not to their spatial extension. In fact, the brightest resilient subhalo has in general a smaller tidal radius than the brightest fragile subhalo although the angular extension on the sky is larger. The central value of θ^*_{68} is slightly smaller for Einasto compared to NFW.

The two subhalo density profiles we consider, NFW and Einasto, are both cuspy. One can wonder what the J-factor and angle PDFs would be for subhalos with a cored profile. The SL17 is tailor-made to handle cold DM subhalos as it partly relies on results from cold DM cosmological simulations. Since subhalos have cuspy profiles in these

FIG. 3. Upper panel: Mass PDF of the brightest subhalo, m^* . Lower panel: Distance-to-Earth PDF of the brightest subhalo, d^* .

simulations, the model cannot deal with cored subhalos in a consistent way; however we can point out some expected differences. First, a cored subhalo with a given m_{200} and c_{200} is less dense than a cuspy subhalo with the same parameters; therefore its J-factor is smaller. Second, a lower density also means that cored subhalos are far more susceptible to tidal stripping and disruption, so subhalos in a cored scenario would be less numerous and less extended. We therefore leave aside any quantitative estimate for cored subhalo profiles, which would require to run dedicated simulations.

As mentioned already in the Introduction, we have no direct information from the simulation for classifying a subhalo as dwarf galaxy or "dark satellite". Nevertheless, we know that, to trigger star formation, a DM subhalo should have a mass of around 10^7 – 10^8 M_\odot , depending on the hydrodynamic simulation; see for example [\[32\].](#page-11-19) If we look at the mass PDF of the brightest subhalo, m^* (Fig. [3](#page-3-1), upper panel), we realize that, in the SL17-fragile model, the brightest halo has a mass typically around 10^8-10^9 M_{\odot} , and so it should definitely form a dwarf galaxy. On the other hand, in the SL17-resilient model, the mass of the

brightest subhalo can be lower (down to 10^6 M_{\odot}), so the halo will not necessarily form a dwarf galaxy. In this case, because the brightest halo is quite close (closer than known dwarf galaxies, Fig. [3](#page-3-1), bottom panel), the J-factor can still be very high. Therefore, whether the brightest halo in the simulation is a dwarf galaxy depends on the subhalo model (SL17-fragile vs SL17-resilient).

We stress that the nature of the subhalo, being it a dwarf galaxy or optically dark, does not affect the conclusions reached in the present paper. The possibility for an extended gamma-ray signal to have a dwarf galaxy optical counterpart, instead, can contribute to firmly identify it as DM subhalo [\[16\].](#page-11-8)

III. SIMULATIONS OF FERMI-LAT DATA

In this section we explain the setup we use to simulate Fermi-LAT data, the analysis pipeline and the statistical framework that we consider to calculate the significance of the detected signal.

A. Data simulation, background and signal model

We run the full analysis on mock LAT data, realistically simulating background models and the instrument response function, and using state-of-the-art detection pipelines.

For simulating and analyzing the data, we use Fermipy, which is a PYTHON package that automates analyses with the Fermitools $[33]$.² Fermipy is designed to perform several high-level analyses of LAT data such as generating simulations, detecting sources, calculating spectral energy distributions (SED) and finding the source extension. We employ the Fermipy version 18.0.0 and the Fermitools version 1.1.7.

We simulate 11 years of gamma-ray data, from 2008 August 4 to 2019 August 4 in the energy range $E =$ $[1, 1000]$ GeV. We consider events belonging to the Pass 8 SOURCEVETO event class, and use the corresponding instrument response function P8R3_SOURCEVETO_V2. When analyzing the data, we select photons passing standard data quality selection criteria [\[35\]](#page-11-21). The simulations of gamma-ray data are performed with the simulate_roi tool. Given a model map (see below for the current model specifications), this tool takes as input the predicted number of counts for the model and generates simulated data binned in energy and space. We bin the simulated data with eight energy bins and angular pixels of size 0.10°. Using the option randomize=True it is possible to randomize the data using Poisson statistics. We will use randomize=False, otherwise differently stated, because we want to test the ideal case of a perfect knowledge of the background components.

We generate mock data sky realizations of a given region of interest (ROI), where we want to test the backgroundonly hypothesis and the background plus signal hypothesis. We consider two different ROIs, representative of typical background configurations at high Galactic latitudes. We define an ROI of $12^{\circ} \times 12^{\circ}$ centered at $(l = 150^{\circ}, b = 60^{\circ})$ for the simulations labeled *high-latitude*, and at $(l =$ 40° , $b = 20^{\circ}$) for the simulations labeled *low-latitude*.

The astrophysical background model includes the Galactic diffuse emission model, pointlike and extended sources selected from the 4FGL catalog [\[36\]](#page-11-22), and an isotropic emission component. In particular, we use the Galactic diffuse emission and isotropic templates released, as official ancillary files, with the 4FGL catalog [\[37\].](#page-11-23)

The signal model is represented by a DM subhalo, centered at the center of the ROI (either high- or lowlatitude). The spectrum of the DM injected signal is normalized by the thermally averaged annihilation cross section, $\langle \sigma v \rangle$, and depends on the mass of the DM particle (we test masses of 10, 100, 1000 GeV). We use a benchmark annihilation channel into b-quarks [\[38\].](#page-11-24) We vary the value of the annihilation cross section from 10^{-27} up to 10^{-22} cm³/s, to check how the detection sensitivity changes with the brightness of the signal. The spatial distribution of the DM signal is built from Eq. [\(1\).](#page-2-1) In order to get an estimate of the uncertainties at play, we select one hundred subhalos within 1σ of the mean of the *J*-factor PDF shown in Fig. [1.](#page-2-0) The analysis is then repeated by using the spatial template corresponding to each of these Jfactors, as injected signal. We consider four different models varying the impact of tidal disruption (SL17-fragile or SL17-resilient) and the subhalo density profile (NFW or Einasto).

If not otherwise specified, we adopt as baseline configuration for signal injection the SL17-resilient subhalo model, an NFW DM subhalo density, a DM mass of 100 GeV, and the high-latitude ROI.

B. Signal reconstruction models

We perform a fit on simulated data using the $qta.fit$ tool, which is a wrapper of the pyLikelihood fit method implemented in the Fermitools. This tool returns the best fit and error of SED parameters and the full covariance matrix of the model. From the fit, we extract the value of the loglikelihood to estimate the significance of the detection of the DM signal with respect to the background-only hypothesis.

In order to reconstruct the injected DM signal and study the detectability of DM subhalos, we make different (spectral and spatial) assumptions on the reconstructed signal. Since, in real data analyses we cannot know the distance and density profile parameters of the subhalo, we try first to detect it as a pointlike source (PS). The fitted SED is a power law, and the free model parameters are normalization and spectral index. Secondly, we test the hypothesis of an extended source (Ext) for which we use a radial Gaussian as spatial template and a power-law SED. ²

 2 See Ref. [\[34\].](#page-11-25)

TABLE I. Models used for the reconstruction of the DM signal: Model name, SED parametrization, spatial distribution (morphology), and number of free parameters in the fit.

Model	Spectrum	Morphology	Number parameters
PS	Power-law	Pointlike	
Ext.	Power-law	Radial Gaussian	3
		$PS+Ext$ Power-law Pointlike $+$ radial Gaussian	5

In this case, the free parameters are the same as the PS case with, in addition, the size of extension, namely the width of the radial Gaussian spatial model. For the extended models, the source extension is computed using the gta.extension tool that performs fits to the data with different sizes of Gaussian and then maximizes the log-likelihood as a function of this parameter, by leaving the SED parameters free as well.

We note that we use here a simple SED for the pointlike or extended source for the following reasons. The sources detected by Fermi-LAT with a significant curvature in the SED (i.e., with a curvature significance larger than 3) are detected, on average, with at least 10σ significance. Since we are interested in this paper to relatively faint sources, our DM halos would not exhibit a significant curvature in the SED. Secondly, the SED of a potential DM halo is at the moment unknown, and the assumptions usually done of DM particles annihilating into a single channel (i.e., with branching ratio equal to 1) could be wrong. Therefore, we decided to test a simple power law for the spectrum and focus the search of a DM signal investigating the spatial extension. Finally, we choose to analyze energies above 1 GeV to minimize the systematic due to the large point spread function and low energy resolution of the LAT at lower energies and because of a more severe contamination of the interstellar emission. Detecting a curvature in the SED below 1 GeV requires a source even brighter than 10σ significance.

In addition, we test a case in which we have a pointlike source plus an extended source, centered at the same position (PS+Ext). Both components have SED modeled as power laws.³ In this case, the free parameters are normalizations, spectral indices and sizes of extension of the two components. We summarize models and parameters in Table [I](#page-5-0). For all the model tested we do not vary the position of the source.

In Fig. [4,](#page-5-1) we compare the angular profiles, calculated as the surface brightness (number of counts per solid angle as

FIG. 4. Surface brightness angular profile of the injected DM signal (black crosses), compared with the angular profiles of the best-fit PS (blue circles), Ext (red stars), and PS+Ext (green plus signs) models.

a function of the angular distance from the ROI center), of the three models adopted for the signal reconstruction, together with the angular profile of the DM injected signal. For each source template, we compute the number of counts for concentric annuli in angular distance, and we divide the number of counts in each annulus by its solid angle. We obtain with this method the surface brightness of the signal. All templates have been convoluted with the instrument angular resolution (point spread function) and are normalized such as to match the DM injected signal at the peak. The PS case provides the poorest fit to the DM emission. In fact, this model produces a flux comparable with the injected signal only in the inner 0.3°, instead at higher angular distances the surface brightness is much smaller than the DM signal. Instead, the Ext starts to deviate significantly from the DM injected signal at distances $>1^{\circ}$, and also in the inner 0.2° it slightly underestimates the flux. On the other hand, the PS+Ext case fits well the DM signal up to ∼1.3°. Also, it well matches the DM injected signal in the inner 0.5°. A point source plus and extended source can therefore provide the best fitting model of the DM injected signal. We will test this possibility in the next section.

C. Statistical significance

Our null hypothesis (H_0) is defined by the backgroundonly model, when we fit the simulated data without any additional DM signal. The alternative hypothesis is instead represented by our reconstructed signal templates (as described above), through which we test the presence of an additional source on top of the astrophysical background.

The reconstructed signal models are all nested models for which Wilk's theorem [\[39\]](#page-11-26) usually applies. As usually

 $3A$ priori the SED of the two components should be constrained to be unique, in order to claim that this is a single source. This being of impractical implementation in Fermipy, we checked a posteriori that, indeed, the best-fit spectral indices are compatible within 1σ . We also notice that the best-fit SED of the PS and Ext models are compatible.

TABLE II. Number of restricted and unrestricted $(n; k)$ parameters used in Eq. [\(2\)](#page-6-3), for the calculation of the statistical significance.

	PS	Ext	$PS+Ext$
	(1; 1)	(1; 2)	(2; 3)
H_0 PS	\cdots	(1; 1)	(1; 2)
Ext	.	\cdots	(1; 1)

done, we define the test statistics as $TS = 2(\log_{10} \mathcal{L}_{H_0}$ $log_{10} \mathcal{L}_{H_1}$). However, Wilk's theorem cannot be applied if some of the parameters of the test hypothesis (in the limit of the null hypothesis) take values on the boundary of the allowed parameter space. As an example, for the PS case, the free fit parameters are the normalization and the spectral index of the SED. This model reduces to the null hypothesis when the normalization tends to zero, which corresponds to the lower bound of its permitted value. If this is the case, the TS distribution is given by a mixed distribution, which depends on the number of parameters whose null value is restricted to be at the boundary of the allowed range, and on those which are not. Following [\[40,41\]](#page-11-27) we can calculate the p-value for a given TS as

$$
p(TS) = 2^{-n} \left(\delta(TS) + \sum_{i=1}^{n} {n \choose i} \chi_{i+k}^2(TS) \right), \quad (2)
$$

where n is the number of restricted parameters (i.e., the parameters that have a boundary condition in the limit of the null hypothesis) and k is the number of unrestricted parameters.

We report in Table [II](#page-6-1), the number of restricted and unrestricted parameters for the hypotheses we compare one with respect to the other.

IV. RESULTS

As described in Sec. [III A](#page-4-0), we create mock data making different assumptions on the DM injected signal, besides testing different source models in the fit. In Fig. [5,](#page-6-2) we show the detection significance (significance of the source model with respect to H_0) for the different signal reconstruction templates (PS, Ext, PS+Ext), and as a function of the injected signal cross section. For illustrative purposes only, we add the case DM, in which we fit mock data with the same DM template used to simulate them, leaving free only the overall normalization of the signal (one restricted parameter). The subhalo model adopted here is SL17 resilient, and we assume an NFW density profile for the subhalos. From this figure we can see at first that, even in the optimistic (as well as unrealistic) case in which we know everything about subhalo properties and position (DM), we could reach a detection significance larger that 3σ (marginal hint) for annihilation cross sections above 3×10^{-26} cm³/s. Such cross sections (for annihilation

FIG. 5. Detection significance as a function of the injected signal annihilation cross section, for different signal reconstruction models (PS in blue, Ext in red, PS+Ext in green, DM in black). The cross sections used for signal injection correspond to the abscissas of the black points; for the other cases the shift along the x axis is for visual ease only (this is true for all other plots in the paper). The subhalo model adopted is SL17 resilient, we assume an NFW density profile for the subhalos, $b\bar{b}$ DM channel and 100 GeV mass.

into b-quarks and DM mass of 100 GeV, i.e., our reference case) are still allowed by current constraints coming from the observation of dwarf spheroidal galaxies [\[4,42\]](#page-11-3), as well as of the Galactic halo at high latitudes [\[43,44\]](#page-11-28). Moreover, given the similar results we get for pointlike and extended templates, such a sensitivity estimate is compatible with what is found for the Fermi-LAT sensitivity to pointlike DM subhalos, e.g., [\[7,9\].](#page-11-5) A firm detection (above 5σ , without accounting for look-elsewhere effects) would instead need cross sections at least as high as $5-6 \times 10^{-26}$ cm³/s—which, again, is not excluded by current gamma-ray constraints. Below the 3σ DM detection significance threshold, all models provide comparable evidence for DM subhalos, as expected. For low cross sections the log-likelihood for the PS and Ext cases are very similar. Since the PS template has less parameters, it gives a slightly higher detection significance. Above cross sections of 3×10^{-26} cm³/s instead the extended template, Ext, starts to provide the best fit among the three reconstructed signal models, with the PS+Ext model giving comparable detection significance.

If not stated otherwise, in what follows, we present results for the Ext template. The PS+Ext case would produce very similar results—with $\langle 2\sigma \rangle$ improvement of the fit when adding a point source component to the extended source for cross sections below 2×10^{-25} cm³/s.

As presented in Sec. [II B](#page-1-1) the SL17-resilient and SL17 fragile models bracket the uncertainty in the modeling of tidal disruption of Galactic DM subhalos. In Fig. [6](#page-7-0) we compare the detection significance obtained with the two

FIG. 6. Detection significance for the Ext signal reconstruction model comparing SL17-resilient (black) and SL17 fragile (blue) subhalo models. We assume an NFW density profile for the subhalos, $b\bar{b}$ DM channel and 100 GeV mass.

subhalo models (for an NFW DM subhalo density profile). The SL17-resilient model provides a much higher detection significance regardless of the injected signal cross section. The difference in significance at fixed cross section is roughly a factor of ∼3. Indeed, for a cross section of 4 × 10^{-26} cm³/s the SL17-fragile model gives 1σ detection significance while the SL17-resilient almost 4σ . This difference in detection significance can be understood by looking at the difference in the J-factor distribution, cf. Fig. [1](#page-2-0) (bottom panel) and can have an impact in the interpretation of the results of real data analyses. In light of this result, detecting subhalos with Fermi-LAT in the SL17 fragile scenario, while respecting the constraints from other targets, seems quite challenging.

FIG. 7. Detection significance for the Ext signal reconstruction model comparing NFW (black) and Einasto (blue) subhalo density profiles, for the SL17-resilient subhalo model. We assume $b\bar{b}$ DM channel and 100 GeV mass.

FIG. 8. Detection significance for the Ext signal reconstruction model comparing subhalos located at two different positions in the Galaxy (see the text for further details). We assume the SL17-resilient subhalo model, an NFW density profile for the subhalos, $b\bar{b}$ DM channel, and 100 GeV mass.

Figure [7](#page-7-1) shows the comparison between NFW and Einasto subhalo density profiles, for the SL17-resilient subhalo model. For a given cross section, the detection significance obtained with an Einasto profile is always larger than the one found with the NFW, by roughly a factor of 2, cf. Fig. [1](#page-2-0) (bottom panel).

Finally, we show the results obtained by placing the DM subhalo at the center of the low-latitude ROI, cf. Fig. [8](#page-7-2). As expected, it is much easier to detect a subhalo (even if extended) at high latitudes than at lower latitudes, where the background from interstellar emission is more intense. The DM subhalo should therefore have larger $\langle \sigma v \rangle$ to produce the same significance as the high-latitude ROI case.

In Fig. [9](#page-8-0), we instead compare the detection sensitivity for different choices of the DM mass. In this case, considering different masses shifts the results along the $\langle \sigma v \rangle$ values. In particular, for a fixed cross section the lower is the mass the higher is the significance for the detection of a subhalo. This is explained by the fact that a less (more) massive DM with respect to the benchmark case (100 GeV) produce a gamma-ray spectrum with a peak at lower (higher) energies. Fermi-LAT has a peak of the sensitivity at about 2–4 GeV. Instead at higher energies the sensitivity increases monotonically.4 Therefore, DM candidates with a peak of the spectrum at a few GeV, such as $b\bar{b}$ annihilation channel with $m_{DM} = 10$ GeV, are detected with the highest significance while candidates with the peak at higher energies have low significance values.

Up to this point we have demonstrated that the brightest DM subhalo can be detected with the highest significance

⁴See this page for the description of the LAT sensitivity as a function of energy [\[45\]](#page-11-29).

FIG. 9. Detection significance for the Ext signal reconstruction model comparing different DM masses for the injected signal. We assume the SL17-resilient subhalo model, an NFW density profile for the subhalos, and $b\bar{b}$ DM channel.

when fitted with an extended source template, either Ext or PS+Ext. Nevertheless, a legitimate question to ask is "Is the evidence for extension significant?"

We quantify the significance for the extension of our simulated signal. We consider the case of one extended source (Ext) fitted to the DM signal. Similar results are found if we consider the case with one point source and one extended source (PS+Ext).

In Fig. [10](#page-8-1) we show the significance for the extension of the source (σ_{EXT}). This is calculated by considering the PS case as null hypothesis and the extended source case, Ext, as test hypothesis. We compute the significance for extension following the procedure highlighted in Sec. [III C.](#page-5-2) We vary several assumptions on the simulated DM signal model: We compare SL17-resilient and SL17-fragile subhalo models (top panel), and the choices of different DM subhalo density profiles for the SL17-resilient case (bottom panel). The SL17-fragile model provides much lower σ_{EXT} with respect to the SL17-resilient case. For example, at a cross section of 10^{-25} cm³/s the SL17-fragile subhalo model gives an average significance for extension of 1.8σ while SL17-resilient gives 4.2σ . On the other hand, the results obtained for Einasto and NFW profiles are comparable. Indeed, for $\langle \sigma v \rangle = 10^{-25}$ cm³/s we get, on average, a significance for extension of 7.5 σ and 4.2 σ , respectively. In all cases, but the SL17-fragile, a marginal detection for extension $(\sim 3\sigma)$ is achieved for cross sections $3-4 \times 10^{-26}$ cm³/s, which are values still permitted by current constraints, as seen above. For the SL17-fragile case a 3σ detection of extension requires, instead, cross sections of about 3×10^{-25} cm³/s, which starts to be in tension with current constraints from dwarf spheroidal galaxies.

In Fig. [11](#page-9-1) we show the reconstructed 68% containment radius (θ_{68} , also equivalent to the standard deviation of the

FIG. 10. Significance of extension (σ_{EXT}) of the Ext template with respect to the PS one, for the subhalos of our simulations. We assume $b\bar{b}$ DM channel and 100 GeV mass. Top panel: Comparison between the SL17-resilient (black) and SL17-fragile (blue) subhalo models, for an NFW DM subhalo profile. Bottom panel: Comparison between an Einasto (blue) and NFW (black) DM subhalo profile, for the SL17-resilient subhalo model.

radial Gaussian template) for different hypotheses on the injected DM signal. In the same plot, we also overlay the theoretical values $\overline{\theta_{68}}$ corresponding to the mean over the θ_{68}^* distribution of the sampled halos, cf. Sec. [II B](#page-1-1). We note that the reconstructed θ_{68} increases with the brightness of the injected signal until it reaches a plateau, which is compatible (within the 1σ error band) with the theoretically predicted value. 5 Indeed, if the DM subhalo signal is too faint the analysis picks up only the more central part of the emission, and thus the size of extension is lower than the simulated one. This trend is visible for all the

⁵We stress however that the theoretically predicted value is computed without convolving the DM template with the point spread function of the instrument, and so it is expected that the measured θ_{68} is slightly larger than the predicted θ_{68}^* .

FIG. 11. Top panel: Reconstructed 68% containment radius (θ_{68}) as a function of the injected annihilation cross section, comparing the SL17-resilient (black) and SL17-fragile (blue) models for an NFW subhalo density profile. We assume an NFW density profile for the subhalos, $b\bar{b}$ DM channel and 100 GeV mass. Bottom panel: Same as the top panel, but for the SL17 resilient model comparing NFW (black) and Einasto (blue) DM density profiles. In both panels, we also overlay theoretical predictions for the average value of θ^*_{68} , i.e., $\overline{\theta^*_{68}}$.

cases considered in this analysis implying that for a faint DM signal the size of extension is underestimated. We stress, however, that, as shown above, even in the case of faint signals where the extension may be underestimated the evidence for the extension is significant—namely above 3σ for cross sections above 3×10^{-26} cm³/s in the SL17resilient case. At the plateau, the size of extension is roughly 0.8° for the SL17-resilient and 0.6° for the SL17 fragile cases and NFW profile, while the theoretical values are 0.74° and 0.56°, respectively. The Einasto and NFW density profiles give very similar results with the Einasto profile which produces slightly smaller values for θ_{68} (0.59° for the SL17-resilient subhalo model).

Finally, we study how the signal reconstruction is affected by randomizing simulated data counts using

FIG. 12. Same as Fig. [5](#page-6-2) for the case in which we randomize (blue) or not (black) the number of counts in each pixel, according to Poisson statistics.

Poisson statistics, i.e., randomize=True. The result is shown in Fig. [12](#page-9-2) for the Ext case. We see that the detection significance is not affected by randomization, and therefore, all conclusions reached above still hold in the case of added random Poisson noise.

V. DISCUSSION AND CONCLUSIONS

A general "belief" is that among Fermi-LAT unidentified sources may shine DM subhalos, although the majority of those should be active galactic nuclei or other galaxies that lack, at the moment, detection in other wavelengths. With the present work, we reassessed the sensitivity of the LAT to signals from the brightest DM subhalo, in the light of the fact that subhalos with the highest J-factor show a significant extension in the sky—as supported by a correlation between subhalo angular extension and J-factor.

We quantified the sensitivity of Fermi-LAT to the brightest extended DM subhalo, by performing realistic simulations of the DM injected signal and analysis reconstruction.We tested different assumptions for the DM subhalo model (SL17 resilient and SL17-fragile) and density profile (NFW and Einasto), as well as different DM masses for the DM injected signal. For the latter, our benchmark is a 100 GeV DM candidate annihilating 100% into b-quark pairs. We fit the DM subhalo source with three different signal reconstruction templates: PS, Ext and PS+Ext.

Our results show that:

(i) For both the SL17-resilient and SL17-fragile models, above 3σ detection significance the extended template, Ext, always provides the best fit among the three reconstructed signal models and also gives a detection significance comparable to the one we would get by fitting the DM injected signal with a perfectly known DM template. A firm detection (above 5σ , without accounting for look elsewhere effects) of DM extended subhalos for the SL17 resilient model can be made for cross sections at least as high as 4×10^{-26} cm³/s (100 GeV DM mass, Einasto density profile), which are not excluded by other gamma-ray constraints yet.

- (ii) For the same DM mass and annihilation channel, the values of the annihilation cross section increase by about a factor of 4 if we consider, instead, the SL17 fragile subhalo model, for both the NFW and Einasto density profiles. This implies that accounting for uncertainty on the subhalo model is a crucial step towards a correct interpretation of DM searches in real data and that the detection of extended subhalos in the SL17-fragile scenario would be challenging, while fulfilling other gamma-ray bounds on the annihilation cross section. On the other hand, the results are not very sensitive to changing the DM density profile within subhalos. In particular using an Einasto or NFW profile provides compatible detection significance.
- (iii) The evidence for extension is always significant for cross sections above $3-4 \times 10^{-26}$ cm³/s (SL17resilient case, for both NFW and Einasto density profiles). In particular, the reconstructed extension for bright signals is compatible with the theoretical expectation from subhalo simulations, while it is slightly underestimated for faint signals.

In the most optimistic case, we showed that for cross sections still allowed by other gamma-ray constraints we can detect DM subhalos with a significance of about 5σ , that the size of extension would be roughly 0.8°, and that the significance of extension would be about 4σ .

As for systematic uncertainties, we studied the case where our simulated data are randomized following Poisson statistics. Adding Poisson noise did not affect the results, and the same conclusions as above hold true in case of counts randomization. Other systematics that can possibly alter the signal detection and extension reconstruction are, for example, a mismatch between the true Galactic diffuse model and the one used in the fit and/or the presence of unmodeled sources or background components close to the subhalo. The systematic uncertainty due to imperfection of Galactic diffuse modeling is alleviated when considering latitudes $|b| > 20^{\circ}$ and energies >1 GeV. Considering the source count distribution of extragalactic sources recently derived in [\[46\]](#page-11-30), we can estimate about 1.0 source per deg² for fluxes above 100 MeV higher than 10^{-10} ph/cm²/s. For fluxes of the order of 10^{-10} ph/cm²/s the TS for detection of a source is typically lower than 25. Assuming this number as an estimate of the density of extragalactic sources that shine below the Fermi-LAT detection threshold, we see that the presence of unmodeled and faint sources could be relevant for the search of DM subhalos, since there should be at least one faint extragalactic object in the innermost 1 deg^2 around the subhalo.

Although we do not address these systematics here, we expect them to be relevant in real data analyses and should be therefore properly taken care of when performing DM subhalo searches in real data.

Our analysis relies on subhalos having a cuspy density profile (NFW or Einasto) in agreement with the predictions of the cold DM scenario. If subhalos have cored profiles instead, they would be fainter and more susceptible to tidal effects, which would decrease their number and spatial extent. We expect this to decrease the detection significance associated to the extension; however the subhalo model we used is not designed to handle cored objects, and dedicated simulations are needed in order to correctly estimate the impact of subhalo distribution and statistics.

We stress that detecting one DM subhalo is a necessary condition for the discovery of DM. However, this may not be of course sufficient to attribute the signal to DM. To this end, it would be of interest, in future, to show what is the LAT sensitivity to the *simultaneous* detection of two or more subhalos. While we limit ourselves to the detectability of the brightest subhalo, we checked what is the statistics of J-factor and angular extension for the second- and thirdbrightest subhalos. We find that both of them have an extension comparable to that of the brightest subhalo and that the corresponding mean *J*-factor are less than 1σ away from J_{tot}^{\star} . In particular, by rescaling our results for the mean J-factors ratios, we can estimate that, in order to detect the second- and the third-brightest subhalos with the same detection significance as the brightest one, we would need an increase of the cross section of a factor of 1.82 (1.70) and 2.63 (2.24) for the SL17-resilient (SL17-fragile) subhalo model.

We expect the general conclusions reached in the present work to apply also to searches for DM subhalo with the upcoming Cherenkov Telescope Array (CTA). CTA will be mostly sensitive to DM masses above 100 GeV. In this DM mass range, given the significant improvement in angular resolution with respect to the LAT, CTA will provide a much better sensitivity to pointlike and extended sources, and therefore improved perspectives for detection of the extension of DM subhalos. A quantitative estimate of such prospects is left for future analysis.

Finally, while our work focused on sensitivity predictions, we foresee the application to real Fermi-LAT data to look for extended DM subhalos, extend previous searches and possibly set constraints on the DM parameter space [\[47\].](#page-11-31)

ACKNOWLEDGMENTS

We warmly thank F. Donato and P. D. Serpico for careful reading of the manuscript and helpful discussions. FC and MS. acknowledge support by the Programme National Hautes Énergies (PNHE) through the AO INSU 2019, Grant No. "DMSubG" (PI: F. Calore). Visits of MDM to LAPTh were supported by Université Savoie Mont-Blanc, Grant No. "DISE" (PI: F. Calore).

- [1] G. Bertone, D. Hooper, and J. Silk, [Phys. Rep.](https://doi.org/10.1016/j.physrep.2004.08.031) 405, 279 [\(2005\).](https://doi.org/10.1016/j.physrep.2004.08.031)
- [2] T. Bringmann and C. Weniger, [Phys. Dark Universe](https://doi.org/10.1016/j.dark.2012.10.005) 1, 194 [\(2012\).](https://doi.org/10.1016/j.dark.2012.10.005)
- [3] L. E. Strigari, [Rep. Prog. Phys.](https://doi.org/10.1088/1361-6633/aaae16) 81, 056901 (2018).
- [4] F. Calore, P. D. Serpico, and B. Zaldivar, [J. Cosmol.](https://doi.org/10.1088/1475-7516/2018/10/029) [Astropart. Phys. 10 \(2018\) 029.](https://doi.org/10.1088/1475-7516/2018/10/029)
- [5] A. Geringer-Sameth and S. M. Koushiappas, [Phys. Rev.](https://doi.org/10.1103/PhysRevLett.107.241303) Lett. 107[, 241303 \(2011\)](https://doi.org/10.1103/PhysRevLett.107.241303).
- [6] M. Ackermann et al. (Fermi-LAT Collaboration), [Phys.](https://doi.org/10.1103/PhysRevLett.115.231301) Rev. Lett. 115[, 231301 \(2015\).](https://doi.org/10.1103/PhysRevLett.115.231301)
- [7] F. Calore, V. De Romeri, M. Di Mauro, F. Donato, and F. Marinacci, Phys. Rev. D 96[, 063009 \(2017\)](https://doi.org/10.1103/PhysRevD.96.063009).
- [8] M. Hütten, M. Stref, C. Combet, J. Lavalle, and D. Maurin, Galaxies 7[, 60 \(2019\)](https://doi.org/10.3390/galaxies7020060).
- [9] F. Calore, M. Hütten, and M. Stref, [Galaxies](https://doi.org/10.3390/galaxies7040090) 7, 90 [\(2019\).](https://doi.org/10.3390/galaxies7040090)
- [10] J. Coronado-Blázquez, M. A. Sánchez-Conde, M. Di Mauro, A. Aguirre-Santaella, I. Ciucă, A. Domínguez, D. Kawata, and N. Mirabal, [J. Cosmol. Astropart. Phys. 11](https://doi.org/10.1088/1475-7516/2019/11/045) [\(2019\) 045.](https://doi.org/10.1088/1475-7516/2019/11/045)
- [11] J. Coronado-Blázquez and M. A. Sánchez-Conde, [Galaxies](https://doi.org/10.3390/galaxies8010005) 8[, 5 \(2019\)](https://doi.org/10.3390/galaxies8010005).
- [12] B. Bertoni, D. Hooper, and T. Linden, [J. Cosmol. Astropart.](https://doi.org/10.1088/1475-7516/2016/05/049) [Phys. 05 \(2016\) 049.](https://doi.org/10.1088/1475-7516/2016/05/049)
- [13] H.-S. Zechlin and D. Horns, [J. Cosmol. Astropart. Phys. 11](https://doi.org/10.1088/1475-7516/2012/11/050) [\(2012\) 050;](https://doi.org/10.1088/1475-7516/2012/11/050) [02 \(2015\) E01.](https://doi.org/10.1088/1475-7516/2015/02/E01)
- [14] B. Bertoni, D. Hooper, and T. Linden, [J. Cosmol. Astropart.](https://doi.org/10.1088/1475-7516/2015/12/035) [Phys. 12 \(2015\) 035.](https://doi.org/10.1088/1475-7516/2015/12/035)
- [15] M. Ackermann et al. (Fermi-LAT Collaboration), [Astro](https://doi.org/10.3847/1538-4365/aacdf7)[phys. J. Suppl. Ser.](https://doi.org/10.3847/1538-4365/aacdf7) 237, 32 (2018).
- [16] I. Ciucă, D. Kawata, S. Ando, F. Calore, J. I. Read, and C. Mateu, [Mon. Not. R. Astron. Soc.](https://doi.org/10.1093/mnras/sty1994) 480, 2284 (2018).
- [17] A. Egorov, A. Galper, N. Topchiev, A. Leonov, S. Suchkov, M. Kheymits, and Y. T. Yurkin, Yad. Fiz. 81[, 360 \(2018\)](https://doi.org/10.7868/S0044002718030108) [[Phys. At. Nucl.](https://doi.org/10.1134/S1063778818030110) 81, 373 (2018)].
- [18] T.-L. Chou, D. Tanoglidis, and D. Hooper, [Phys. Dark](https://doi.org/10.1016/j.dark.2018.05.001) Universe 21[, 1 \(2018\)](https://doi.org/10.1016/j.dark.2018.05.001).
- [19] M. Stref and J. Lavalle, *Phys. Rev. D* **95**[, 063003 \(2017\).](https://doi.org/10.1103/PhysRevD.95.063003)
- [20] P. J. McMillan, [Mon. Not. R. Astron. Soc.](https://doi.org/10.1093/mnras/stw2759) 465, 76 (2017).
- [21] J. F. Navarro, C. S. Frenk, and S. D. M. White, [Astrophys. J.](https://doi.org/10.1086/177173) 462[, 563 \(1996\)](https://doi.org/10.1086/177173).
- [22] J. Wang, S. Bose, C. S. Frenk, L. Gao, A. Jenkins, V. Springel, and S. D. M. White, [Nature \(London\)](https://doi.org/10.1038/s41586-020-2642-9) 585, 39 [\(2020\).](https://doi.org/10.1038/s41586-020-2642-9)
- [23] J. Diemand, M. Kuhlen, P. Madau, M. Zemp, B. Moore, D. Potter, and J. Stadel, [Nature \(London\)](https://doi.org/10.1038/nature07153) 454, 735 (2008).
- [24] V. Springel, J. Wang, M. Vogelsberger, A. Ludlow, A. Jenkins, A. Helmi, J. F. Navarro, C. S. Frenk, and S. D. M. White, [Mon. Not. R. Astron. Soc.](https://doi.org/10.1111/j.1365-2966.2008.14066.x) 391, 1685 (2008).
- [25] F. C. van den Bosch, G. Ogiya, O. Hahn, and A. Burkert, [Mon. Not. R. Astron. Soc.](https://doi.org/10.1093/mnras/stx2956) 474, 3043 (2018).
- [26] R. Errani and J. Peñarrubia, [Mon. Not. R. Astron. Soc.](https://doi.org/10.1093/mnras/stz3349) 491, [4591 \(2020\)](https://doi.org/10.1093/mnras/stz3349).
- [27] F. C. van den Bosch and G. Ogiya, [Mon. Not. R. Astron.](https://doi.org/10.1093/mnras/sty084) Soc. 475[, 4066 \(2018\)](https://doi.org/10.1093/mnras/sty084).
- [28] M. Stref, T. Lacroix, and J. Lavalle, Galaxies 7[, 65 \(2019\).](https://doi.org/10.3390/galaxies7020065)
- [29] A. Charbonnier, C. Combet, and D. Maurin, [Comput. Phys.](https://doi.org/10.1016/j.cpc.2011.10.017) Commun. 183[, 656 \(2012\)](https://doi.org/10.1016/j.cpc.2011.10.017).
- [30] V. Bonnivard, M. Hütten, E. Nezri, A. Charbonnier, C. Combet, and D. Maurin, [Comput. Phys. Commun.](https://doi.org/10.1016/j.cpc.2015.11.012) 200, 336 [\(2016\).](https://doi.org/10.1016/j.cpc.2015.11.012)
- [31] M. Hütten, C. Combet, and D. Maurin, [Comput. Phys.](https://doi.org/10.1016/j.cpc.2018.10.001) Commun. 235[, 336 \(2019\)](https://doi.org/10.1016/j.cpc.2018.10.001).
- [32] Q. Zhu, F. Marinacci, M. Maji, Y. Li, V. Springel, and L. Hernquist, [Mon. Not. R. Astron. Soc.](https://doi.org/10.1093/mnras/stw374) 458, 1559 (2016).
- [33] M. Wood, R. Caputo, E. Charles, M. Di Mauro, J. Magill, J. S. Perkins, and Fermi-LAT Collaboration, Proc. Sci., ICRC2017 (2018) 824 [\[arXiv:1707.09551](https://arXiv.org/abs/1707.09551)].
- [34] [http://fermipy.readthedocs.io/en/latest/.](http://fermipy.readthedocs.io/en/latest/)
- [35] [https://fermi.gsfc.nasa.gov/ssc/data/analysis/documentation/](https://fermi.gsfc.nasa.gov/ssc/data/analysis/documentation/Cicerone/Cicerone_Data_Exploration/Data_preparation.html) [Cicerone/Cicerone_Data_Exploration/Data_preparation.html.](https://fermi.gsfc.nasa.gov/ssc/data/analysis/documentation/Cicerone/Cicerone_Data_Exploration/Data_preparation.html)
- [36] S. Abdollahi et al. (Fermi-LAT Collaboration), [Astrophys.](https://doi.org/10.3847/1538-4365/ab6bcb) [J. Suppl. Ser.](https://doi.org/10.3847/1538-4365/ab6bcb) 247, 33 (2020).
- [37] https://fermi.gsfc.nasa.gov/ssc/data/access/lat/8yr_catalog/.
- [38] [https://fermi.gsfc.nasa.gov/ssc/data/analysis/scitools/source_](https://fermi.gsfc.nasa.gov/ssc/data/analysis/scitools/source_models.html#DMFitFunction) [models.html#DMFitFunction](https://fermi.gsfc.nasa.gov/ssc/data/analysis/scitools/source_models.html#DMFitFunction).
- [39] S. S. Wilks, [Ann. Math. Stat.](https://doi.org/10.1214/aoms/1177732360) 9, 60 (1938).
- [40] S. G. Self and K.-Y. Liang, [J. Am. Stat. Assoc.](https://doi.org/10.1080/01621459.1987.10478472) 82, 605 [\(1987\).](https://doi.org/10.1080/01621459.1987.10478472)
- [41] O. Macias, C. Gordon, R. M. Crocker, B. Coleman, D. Paterson, S. Horiuchi, and M. Pohl, [Nat. Astron.](https://doi.org/10.1038/s41550-018-0414-3) 2, 387 [\(2018\).](https://doi.org/10.1038/s41550-018-0414-3)
- [42] A. Albert et al. (Fermi-LAT and DES Collaborations), [Astrophys. J.](https://doi.org/10.3847/1538-4357/834/2/110) 834, 110 (2017).
- [43] H.-S. Zechlin, S. Manconi, and F. Donato, [Phys. Rev. D](https://doi.org/10.1103/PhysRevD.98.083022) 98, [083022 \(2018\).](https://doi.org/10.1103/PhysRevD.98.083022)
- [44] L. J. Chang, M. Lisanti, and S. Mishra-Sharma, [Phys. Rev.](https://doi.org/10.1103/PhysRevD.98.123004) D 98[, 123004 \(2018\)](https://doi.org/10.1103/PhysRevD.98.123004).
- [45] [https://www.slac.stanford.edu/exp/glast/groups/canda/lat_](https://www.slac.stanford.edu/exp/glast/groups/canda/lat_Performance.htm) [Performance.htm](https://www.slac.stanford.edu/exp/glast/groups/canda/lat_Performance.htm).
- [46] L. Marcotulli, M. Di Mauro, and M. Ajello, [Astrophys. J.](https://doi.org/10.3847/1538-4357/ab8cbd) 896[, 6 \(2020\).](https://doi.org/10.3847/1538-4357/ab8cbd)
- [47] F. Calore, M. Di Mauro, and M. Stref (to be published).