

High-resolution, 3D radiative transfer modelling

III. The DustPedia barred galaxies

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ABSTRACT

Context. Dust in late-type galaxies in the local Universe is responsible for absorbing approximately one third of the energy emitted by stars. It is often assumed that dust heating is mainly attributable to the absorption of ultraviolet and optical photons emitted by the youngest (≤ 100 Myr) stars. Consequently, thermal re-emission by dust at far-infrared wavelengths is often linked to the star-formation activity of a galaxy. However, several studies argue that the contribution to dust heating by much older stellar populations might be more significant than previously thought. Advances in radiation transfer simulations finally allow us to actually quantify the heating mechanisms of diffuse dust by the stellar radiation field.

Aims. As one of the main goals in the DustPedia project, we have developed a framework to construct detailed 3D stellar and dust radiative transfer models for nearby galaxies. In this study, we analyse the contribution of the different stellar populations to the dust heating in four nearby face-on barred galaxies: NGC 1365, M 83, M 95, and M 100. We aim to quantify the fraction directly related to young stellar populations, both globally and on local scales, and to assess the influence of the bar on the heating fraction.

Methods. From 2D images we derive the 3D distributions of stars and dust. To model the complex geometries, we used SKIRT, a state-of-the-art 3D Monte Carlo radiative transfer code designed to self-consistently simulate the absorption, scattering, and thermal re-emission by the dust for arbitrary 3D distributions.

Results. We derive global attenuation laws for each galaxy and confirm that galaxies of high specific star-formation rate have shallower attenuation curves and weaker UV bumps. On average, 36.5% of the bolometric luminosity is absorbed by dust in our galaxy sample. We report a clear effect of the bar structure on the radial profiles of the dust-heating fraction by the young stellar populations, and the dust temperature. We find that the young stellar populations are the main contributors to the dust heating, donating, on average $\sim 59\%$ of their luminosity to this purpose throughout the galaxy. This dust-heating fraction drops to $\sim 53\%$ in the bar region and $\sim 38\%$ in the bulge region where the old stars are the dominant contributors to the dust heating. We also find a strong link between the heating fraction by the young stellar populations and the specific star-formation rate.

Key words. radiative transfer – dust, extinction – galaxies: ISM – infrared: ISM

1. Introduction

Cosmic dust is one of the fundamental ingredients of the interstellar medium (ISM), and considerably affects many physical

and chemical processes. Although dust makes up a small fraction of the total mass of a galaxy, it is responsible for the attenuation and reddening effects at ultraviolet (UV) and optical wavelengths (Galliano et al. 2018). In “typical” modern

late-type galaxies, dust absorbs roughly 30% of the total starlight (Popescu & Tuffs 2002; Skibba et al. 2011; Viaene et al. 2016; Bianchi et al. 2018), and converts this energy to radiation at the mid-infrared (MIR), far-infrared (FIR), and sub-millimetre (submm) wavelengths (Soifer & Neugebauer 1991). Dust emission in those regimes is often used to trace star-formation activity either from MIR and FIR measurements alone (Calzetti et al. 2007; Chang et al. 2015; Davies et al. 2016), or from FIR measurements combined with UV and optical data (Kennicutt 1998; Kennicutt et al. 2009; Kennicutt & Evans 2012). However, the contribution of the old, more evolved, stars to the dust heating can be non-negligible (e.g. Hinz et al. 2004; Calzetti et al. 2010; Bendo et al. 2010, 2012, 2015; Boquien et al. 2011; Smith et al. 2012; De Looze et al. 2014; Viaene et al. 2017; Leja et al. 2019; Nersesian et al. 2019) and therefore needs to be taken into account while estimating the star-formation rate (SFR) of a galaxy.

In the last decade, spectral energy distribution (SED) fitting codes that use Bayesian analysis and cover broader wavelength ranges rose in number and popularity. SED fitting codes can model panchromatic datasets by enforcing an energy conservation between the absorbed starlight and the re-emitted photons by dust, at longer wavelengths. Codes such as CIGALE (Code Investigating GALaxy Emission; Noll et al. 2009; Boquien et al. 2019) and MAGPHYS (da Cunha et al. 2008), among many others, make use of libraries and templates that account for the stellar and dust emission of galaxies, providing information about the stellar and dust content, and the efficiency of the interstellar radiation field (ISRF) to heat the dust. Despite their rise in popularity, an important caveat of SED fitting still remains: the use of empirical attenuation laws that lack any constraints on the 3D geometry of stars and dust in galaxies. Some codes use different attenuation for young and old stellar populations (SP), but this leads to extra parameters and consequently to degeneracies.

For an accurate and self-consistent representation of the dust-heating processes in galaxies, high-resolution, 3D radiative transfer (RT) modelling is required. Such simulations take into account the complex geometrical distribution of stars and dust (constrained by well-resolved imaging observations), while creating a realistic description of the ISRF as it propagates through the dusty medium. Previous 3D radiative transfer studies have also stressed the importance of non-local dust heating (e.g. De Looze et al. 2012a, 2014; Viaene et al. 2017; Williams et al. 2019), an effect that is not considered in global SED fitting methods or in pixel-by-pixel SED fits. Quantifying the relative contribution of the dust-heating sources through radiation transfer will enable us to obtain an indicative estimation of the current star-forming activity and a better insight on the dust properties in nearby galaxies.

The first detailed radiation transfer models were performed for a slew of edge-on galaxies, using axially symmetric models. Edge-on galaxies offer valuable information on the vertical and radial distribution of their stellar and dust components (Xilouris et al. 1999; Bianchi 2007; Baes et al. 2010; De Looze et al. 2012b,a; De Geyter et al. 2014, 2015; Mosenkov et al. 2016, 2018). While edge-on galaxies provide significant insight on the vertical and radial structures of galaxies, their main drawback is the lack of insight in the spatial distribution of star-forming regions and the clumpiness of the ISM (Saftly et al. 2015). In that sense, well-resolved, face-on galaxies are excellent objects to study since we can identify with great detail the star-forming regions as well as recover the asymmetric stellar and dust geometries.

A novel technique was developed by De Looze et al. (2014) for the panchromatic radiative transfer modelling of

well-resolved face-on galaxies. They used observational images to derive the stellar and dust distributions, and then accurately described the starlight-dust interactions. The authors applied this technique to the grand-design spiral galaxy M 51 (NGC 5194). They found that the contribution of the older stellar population to the dust heating is significant, with an average contribution to the total infrared (TIR) emission reaching up to 37%. Viaene et al. (2017) and Williams et al. (2019) adopted the same technique and built a radiative transfer model of the Andromeda galaxy (M 31) and the Triangulum Galaxy (M 33), respectively. Williams et al. (2019) found that dust in M 33 absorbs 28% of the energy emitted by the old stellar population, while in M 31 the old stellar population is the dominant dust-heating source with the average contribution being around 91% (Viaene et al. 2017). Furthermore, those three studies have shown that the relative contribution of the young stars to the dust heating varies strongly with location and wavelength.

Within the scope of the DustPedia¹ (Davies et al. 2017) project, we have developed a framework to construct detailed 3D panchromatic radiative transfer models for nearby galaxies with the SKIRT Monte Carlo code (Baes et al. 2011; Camps & Baes 2015). Where previous works (e.g. De Looze et al. 2014; Viaene et al. 2017; Williams et al. 2019) dealt with single individual galaxies, each with their own modelling strategy, here we take advantage of the standardised multi-wavelength imagery data available in the DustPedia archive² (Clark et al. 2018), and we apply a uniform strategy for the 3D radiative transfer modelling to a small sample of face-on galaxies with different characteristics. The full description and strategy of our modelling framework is presented in Verstocken et al. (2020). The authors applied this state-of-the-art modelling approach to the early-type spiral galaxy M 81 (NGC 3031). In this work we continue this kind of analysis by modelling four late-type barred galaxies; NGC 1365, NGC 5236 (M 83), NGC 3351 (M 95), and NGC 4321 (M 100). Barred galaxies are of particular interest since bars have a strong impact on the physical and chemical evolution of the ISM. It is generally considered that bars funnel molecular gas from the disc towards the central regions of galaxies, fuelling active nuclei and central starbursts (e.g. Casasola et al. 2011; Combes et al. 2013, 2014). The 3D distribution of stars and dust in the bars of galaxies could shed light on the physics of the dominant stellar component in both discs and bars.

This paper is structured as follows. In Sect. 2 we present the properties of our galaxy sample as well as a brief description of each galaxy analysed in this study. Section 3 briefly outlines our modelling approach while in Sect. 4 we validate our results. In Sect. 5 we show how the contribution of the different stellar populations shapes the SEDs of the galaxies and quantify their contribution to the dust heating. Our main conclusions are summarised in Sect. 6.

2. Galaxy sample and data

For the purposes of this work, we selected galaxies from the DustPedia sample (Davies et al. 2017) with large angular diameters, so that they are well-resolved even at infrared and submm wavelengths. The sample consists of four nearby, spiral galaxies with a prominent bar in their centres; NGC 1365, M 83, M 95, and M 100. All four galaxies have a small or moderate inclination and optical discs larger than 7 arcmin in diameter. We also selected these galaxies to be roughly representative of

¹ <http://www.dustpedia.com>

² <http://dustpedia.astro.noa.gr>

Table 1. Basic properties of the galaxies in our sample.

Galaxy ID	Hubble stage ^(a) [<i>T</i>]	Type ^(b)	Nuclear activity	Distance ^(c) [Mpc]	Apparent size [arcmin]	Position angle	Inclination ^(d)
NGC 1365	3.2	SB(s)b	Seyfert 1.8	17.9 ± 2.7 ($1'' = 86$ pc)	11.2×6.2	132:0	54:5
M 83 (NGC 5236)	5.0	SAB(s)c	Starburst	7.0 ± 4.1 ($1'' = 34$ pc)	12.9×11.5	137:0	19:5
M 95 (NGC 3351)	3.1	SB(r)	Starburst	10.1 ± 1.0 ($1'' = 49$ pc)	7.4×5.0	101:2	45:5
M 100 (NGC 4321)	4.1	SAB(s)	HII/LINER	15.9 ± 2.5 ($1'' = 77$ pc)	7.4×6.3	84:1	34:9

References. ^(a)From Makarov et al. (2014). ^(b)From de Vaucouleurs et al. (1995). ^(c)From Sheth et al. (2010). ^(d)From Mosenkov et al. (2019).

early-, mid-, and late-type barred spirals, with the basic properties of each galaxy given in Table 1. For two of them (NGC 1365 and M 83) a detailed analysis of the radial distribution of stars, gas, dust, and SFR is presented in Casasola et al. (2017).

NGC 1365 (Fig. 1a), also known as the Great Barred Spiral Galaxy, is one of the best studied barred galaxies in the nearby Universe and is located in the Fornax cluster at a distance of 17.9 Mpc (Sheth et al. 2010). NGC 1365 has been classified as an SB(s)b type galaxy by de Vaucouleurs et al. (1995) with a Hubble stage of $T = 3.2$. This truly impressive galaxy, with a major axis twice as large as of the Milky-Way (~ 60 kpc), displays strong ongoing star formation in the centre (Lindblad 1999) and hosts a bright Seyfert 1.8 nucleus (Véron-Cetty & Véron 2006). Two massive prominent dust lanes along the nuclear bar can be seen in optical images (Teuben et al. 1986), while the well developed spiral arms extend from the bar edges with the tendency to turn inwards at the outer edges of the galaxy (Lindblad et al. 1996). According to Nersesian et al. (2019), this massive galaxy contains more than $8 \times 10^{10} M_{\odot}$ of stars, $10^8 M_{\odot}$ of dust, and shows a SFR of $13 M_{\odot} \text{ yr}^{-1}$. Its HI gas mass is measured to be $9.5 \times 10^9 M_{\odot}$ (De Vis et al. 2019) and its H₂ gas mass $3 \times 10^9 M_{\odot}$ (Zabel et al. 2019).

M 83 (NGC 5236, Fig. 1b) is a grand-design spiral galaxy, with a strong bar in the centre and prominent dust lanes connecting the central region to the disc. M 83 is an SAB(s)c ($T = 5$) galaxy as classified by de Vaucouleurs et al. (1995), representing a “typical” nearby grand-design Sb-Sc galaxy, and is located at a distance of 7.0 Mpc (Sheth et al. 2010). It has a nearly face-on orientation, with an estimated inclination of $19^{\circ}.5$. The nuclear region is a site of strong starburst activity (Telesco & Harper 1980; Turner et al. 1987), with dynamical studies showing that gas is funnelled along the bar producing high rates of star formation at the centre (Knapen et al. 2010). According to Nersesian et al. (2019), M 83 has a stellar mass, dust mass, and integrated SFR of $3 \times 10^{10} M_{\odot}$, $2 \times 10^7 M_{\odot}$, and $6.7 M_{\odot} \text{ yr}^{-1}$, respectively. Its HI gas mass is measured to be more than $2 \times 10^9 M_{\odot}$ (De Vis et al. 2019).

M 95 (NGC 3351, Fig. 1c) is a nearby early-type barred spiral galaxy, located at a distance of 10.1 Mpc (Sheth et al. 2010). The morphological classification of the galaxy is SB(r) (de Vaucouleurs et al. 1995), with a Hubble stage of $T = 3.1$. M 95 is the host of a compact star-forming circumnuclear ring with a diameter approximately 0.7 kpc, and a larger ring of molecular gas regions surrounding the stellar bar of the galaxy (Knapen et al. 2002). Multi-wavelength, sub-kpc studies have shown that the central region is mainly populated by young stars (Mazzalay et al. 2013), whereas the bar region mainly hosts an older stellar population (James & Percival 2016). According to Nersesian et al. (2019), M 95 contains a stellar mass, dust mass, and SFR of $3 \times 10^{10} M_{\odot}$, $8 \times 10^6 M_{\odot}$, and $1.1 M_{\odot} \text{ yr}^{-1}$, respectively. According to De Vis et al. (2019), this galaxy has an HI gas mass of $10^9 M_{\odot}$.

M 100 (NGC 4321, Fig. 1d) is located at a distance of 15.9 Mpc (Sheth et al. 2010) and it is a member of the Virgo Cluster. M 100 has been classified as SAB(s) by de Vaucouleurs et al. (1995), with two well-defined, symmetrical spiral arms emerging from the bar in the galactic centre. M 100 also hosts a circumnuclear ring with a diameter of 2 kpc. Ho et al. (1997) classified the nucleus as HII/LINER. The present-day SFR is estimated to be around $6 M_{\odot} \text{ yr}^{-1}$ (Nersesian et al. 2019). M 100 has approximately $5 \times 10^{10} M_{\odot}$ of stars, $4 \times 10^7 M_{\odot}$ of dust (Nersesian et al. 2019), and $3 \times 10^9 M_{\odot}$ of HI gas (De Vis et al. 2019).

For all the galaxies in this work, we used imagery data available in the DustPedia archive. These datasets are a combination of images observed by ground-based and space telescopes: GALaxy Evolution eXplorer (GALEX; Morrissey et al. 2007), Sloan Digital Sky Survey (SDSS; York et al. 2000; Eisenstein et al. 2011), 2 Micron All-Sky Survey (2MASS; Skrutskie et al. 2006), Wide-field Infrared Survey Explorer (WISE; Wright et al. 2010), *Spitzer* (Werner et al. 2004); *Herschel* (Pilbratt et al. 2010); and *Planck* (Planck Collaboration XXIV 2011), covering a broad wavelength range from the UV to the submm wavelength domain. For each galaxy, we automatically retrieved more than 24 images from the DustPedia archive through our modelling pipeline PTS³ (Python Toolkit for SKIRT⁴; Verstocken et al. 2020). Since SDSS data were not available for NGC 1365 and M 83, we manually downloaded and processed an R_c -band image (Lauberts & Valentijn 1989) for each galaxy from the NASA Extragalactic Database (NED)⁵. Supplementary to those images, properly processed (stellar continuum-subtracted) $H\alpha$ images were retrieved from NED for all galaxies.

We pre-processed all images using an automatic procedure as was developed in our modelling framework. First, foreground stars were identified from the 2MASS All-Sky Catalog of Point Sources (Cutri et al. 2003), and removed from the GALEX, SDSS, 2MASS, WISE, and *Spitzer* images. Then, all images were corrected for background emission and Galactic extinction. To determine the attenuation in the UV bands we used the V -band attenuation, A_V , depending on the position of each galaxy, obtained by querying the IRSA Dust Extinction Service⁶, and by assuming an average extinction law in the Milky-Way (MW), $R_V = 3.1$ (Cardelli et al. 1989).

Although multi-wavelength global photometry (Clark et al. 2018) is available in the DustPedia archive for all 875 DustPedia galaxies, we performed our own custom aperture photometry using PTS. The reason behind this choice was to ensure that the measurement of the flux densities between observed and simulated images is consistent. The measured flux densities

³ http://www.skirt.ugent.be/pts8/_p_t_s.html

⁴ <http://www.skirt.ugent.be/>

⁵ <https://ned.ipac.caltech.edu>

⁶ <https://irsa.ipac.caltech.edu/applications/DUST>

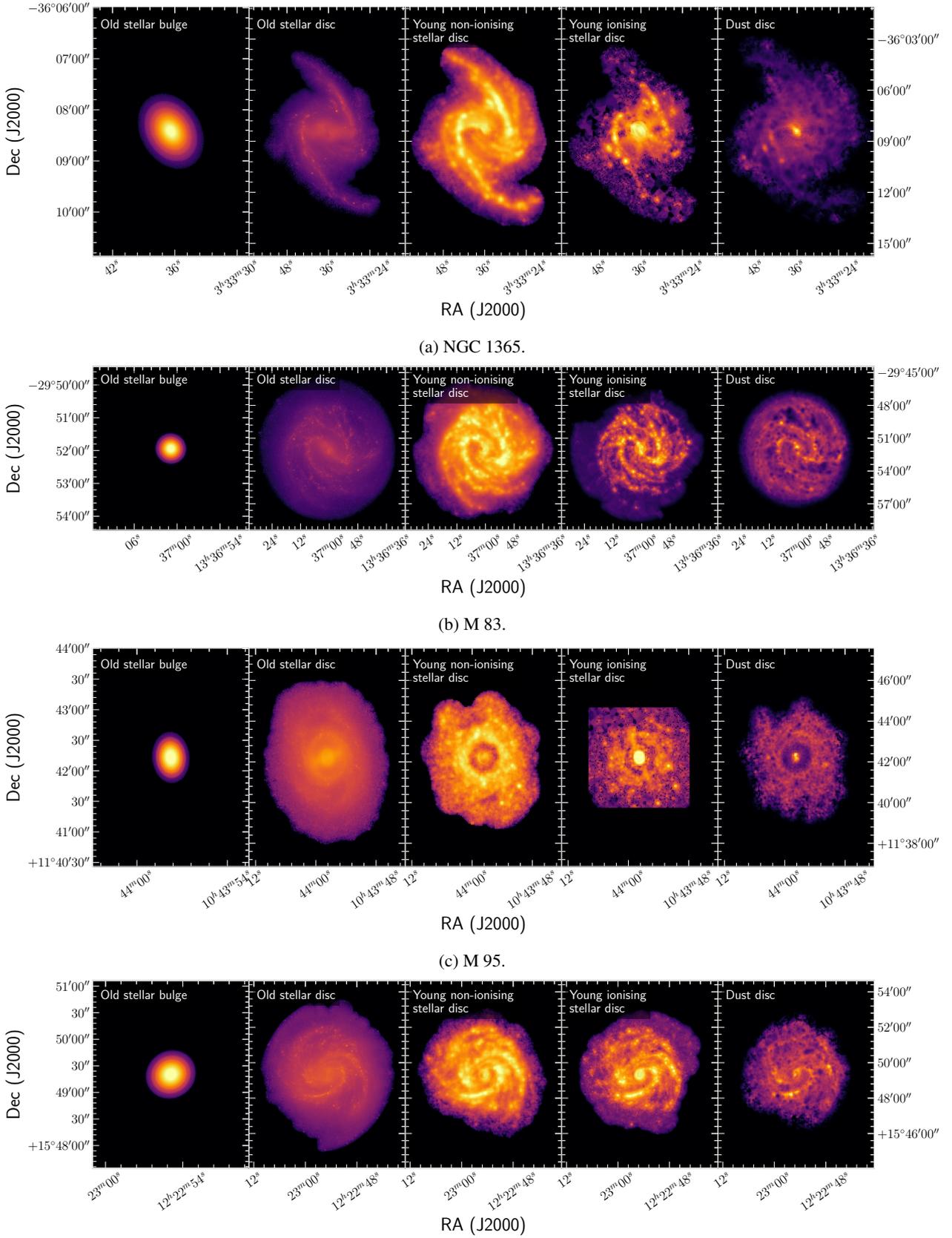


Fig. 1. 2D maps of different components of each galaxy. The model includes an old stellar bulge and disc component, a young non-ionising and ionising stellar disc, as well as a dust disc. The bulge image has been generated with SKIRT using a Sérsic profile geometry. The resolution of each map is based on the respective observations. The extent of the different components is due to the exclusion of unphysical pixels based on the different signal-to-noise ratio (S/N) in each band. The colour coding is in log scale and reflects a normalised flux density.

Table 2. Overview of the different stellar populations and dust components in our model.

Component	2D geometry	Vertical dimension	SED template	Normalisation
Bulge				
Old SP (8 Gyr)	Sérsic profile geometry ^(a)		Bruzual & Charlot (2003)	3.6 μm
Disc		Exponential profile		
Old SP (8 Gyr)	IRAC 3.6 μm ^(b)	$(h_{\text{disc}, z})$ ^(f)	Bruzual & Charlot (2003)	3.6 μm
Young non-ionising SP (100 Myr)	GALEX FUV ^(c)	$h_{\text{yni}, z} = 1/2 \times h_{\text{disc}, z}$	Bruzual & Charlot (2003)	FUV
Young ionising SP (10 Myr)	$H\alpha + 0.031 \times \text{MIPS } 24 \mu\text{m}$ ^(d)	$h_{\text{yi}, z} = 1/4 \times h_{\text{disc}, z}$	MAPPINGS III ^(g)	FUV
Dust	FUV attenuation map ^(e)	$h_{\text{dust}, z} = 1/2 \times h_{\text{disc}, z}$	THEMIS dust mix ^(h)	Total dust mass

Notes. ^(a)The parameters of the flattened Sérsic profile, like the effective radius R_e , Sérsic index n , and intrinsic flattening factor q , were retrieved from the S⁴G database (Sheth et al. 2010; Salo et al. 2015). ^(b)Image corrected for bulge emission. ^(c)Image corrected for old SP emission and dust attenuation (Cortese et al. 2008; Galametz et al. 2013), using images from IRAC 3.6 μm , SDSS r , MIPS 24 μm , and PACS 70-, 100-, 160 μm . ^(d)Image corrected for old SP emission. The map was constructed based on the prescription of Calzetti et al. (2007). ^(e)The dust map was constructed based on the prescriptions of Cortese et al. (2008) and Galametz et al. (2013). We used images from GALEX FUV, SDDS r , MIPS 24 μm , and PACS 70-, 100-, 160 μm . ^(f)We assumed an exponential distribution with a scale height h_z in the vertical direction. The scale height for the old SP is, $h_{\text{disc}, z} = 1/8.26 \times h_R$ (De Geyter et al. 2014), where h_R is the scale length. ^(g)Groves et al. (2008). ^(h)Jones et al. (2017).

and uncertainties of the observed images are given in Table A.1. Throughout the paper we parameterise the galaxy morphology using the Hubble stage (T), the values of which have been retrieved from the HyperLEDA database (Makarov et al. 2014)⁷. The inclination angle of each galaxy was estimated based on the method described in Mosenkov et al. (2019).

3. Radiative transfer model

In this section we briefly lay out the steps we followed to construct our model galaxies. Our purpose is to apply the same systematic approach, introduced in Verstocken et al. (2020), for a sample of barred galaxies. For the complete description of our modelling procedure and strategy we refer the reader to Verstocken et al. (2020).

3.1. Radiative transfer simulations with SKIRT

To generate a 3D radiative transfer model of each galaxy, we used the code SKIRT (Baes et al. 2011; Camps & Baes 2015). SKIRT is a radiative transfer code that allows the construction of 3D panchromatic models by using a Monte Carlo approach. The code is designed in a way that it can take into account all relevant physical processes such as scattering, absorption, and thermal re-emission by dust, for a wide variety of environments. SKIRT is equipped with a large collection of possible geometries and geometry decorators (Baes & Camps 2015), efficient grid structures (Saftly et al. 2013, 2014; Camps et al. 2013), and hybrid parallelisation techniques (Verstocken et al. 2017). De Looze et al. (2014) implemented a new feature in the code that allows the construction of the complex 3D structures seen in galaxies, from 2D images. The 2D geometry is deprojected and then according to a vertical exponential profile it is smeared out in the vertical direction, so that the flux density is conserved during the conversion from 2D to 3D.

3.2. Modelling approach

The model for every galaxy consists of four stellar components and a dust component. We considered an old stellar bulge, an old stellar disc, a young non-ionising stellar disc, a young

ionising stellar disc, and a dust disc. We modelled the old and young non-ionising stellar populations using the Bruzual & Charlot (2003) single stellar population (SSP) templates of solar metallicity $Z = 0.02$, typical ages of 8 Gyr and 100 Myr, respectively, and a Chabrier (2003) initial mass function (IMF). For the young ionising population we adopted the SED templates from MAPPINGS III (Groves et al. 2008) assuming an age of 10 Myr. There are five parameters that define the MAPPINGS III templates, namely: the mean cluster mass (M_{cl}), the gas metallicity (Z), the compactness of the clusters (C), the pressure of the surrounding ISM (P_0), and the covering fraction of the molecular cloud photo-dissociation regions (f_{PDR}). The following parameters were used as our default values: $Z = 0.02$, $M_{\text{cl}} = 10^5 M_{\odot}$, $\log C = 6$, $P_0/k = 10^6 \text{ K cm}^{-3}$, and $f_{\text{PDR}} = 0.2$ (Verstocken et al. 2020). Despite the fact that all four galaxies have a prominent bar in their central region, we did not treat the bar as a separate component here. Instead we treated the bar and the galactic disc as a single structure to keep the modelling procedure in line with the DustPedia standard.

Based on the observed images of the individual galaxies at different wavelengths, we were able to generate the geometrical distribution of each of the input components. We modelled the bulge of each galaxy with a flattened Sérsic profile. The decomposition parameters of the Sérsic geometry were retrieved from the S⁴G database⁸ (Spitzer Survey of Stellar Structure in Galaxies: Sheth et al. 2010; Salo et al. 2015) and we fixed the total luminosity such that it corresponds to the bulge luminosity, measured from the InfraRed Array Camera (IRAC; Fazio et al. 2004) 3.6 μm image. To derive the stellar and dust geometries in the disc of each galaxy, we combined different images to create physical maps that characterise, for example, the density distribution of the diffuse dust or old stellar population on the galaxy. The different components can be seen in Fig. 1, while in Table 2 we provide an overview of the images and templates used for the different stellar and dust components in our model. The details on how we generated these physical maps are presented in Verstocken et al. (2020).

For the dust composition we used the DustPedia reference dust model THEMIS⁹ (The Heterogeneous Evolution Model for Interstellar Solids; Jones et al. 2013, 2017; Köhler et al. 2014). The adopted THEMIS model is for the MW diffuse ISM and even

⁷ <http://leda.univ-lyon1.fr>

⁸ https://www.oulu.fi/astronomy/S4G_PIPELINE4/MAIN

⁹ https://www.ias.u-psud.fr/themis/THEMIS_model.html

Table 3. Overview of the model parameters for all four galaxies.

Description		Parameters	NGC 1365	M 83	M 95	M 100
Fixed parameters	Sérsic parameters ^(a)	n	0.857	0.664	0.563	0.639
		q	0.577	0.897	0.256	0.795
		R_e [pc]	826	236	314	557
	Scale heights ^(b)	$h_{\text{disc}, z}$ [pc]	1000	436	344	572
		$h_{\text{yni}, z}$ [pc]	500	218	172	286
		$h_{\text{yi}, z}$ [pc]	250	109	86	143
		$h_{\text{dust}, z}$ [pc]	500	218	172	286
	Old SP luminosity	$L_{\text{bulge}, 3.6}$ [$10^9 L_{\odot}$]	2.60	0.68	0.35	0.67
		$L_{\text{disc}, 3.6}$ [$10^9 L_{\odot}$]	7.52	7.54	1.87	5.96
	Free parameters	Initial guess	$L_{\text{yni}, \text{FUV}}^{\text{init}}$ [$10^{10} L_{\odot}$]	3.82	4.26	0.29
$L_{\text{yi}, \text{FUV}}^{\text{init}}$ [$10^{10} L_{\odot}$]			2.45	1.26	0.20	1.13
$M_{\text{dust}}^{\text{init}}$ [$10^7 M_{\odot}$]			10.1	2.01	0.82	3.70
Best-fit		$L_{\text{yni}, \text{FUV}}$ [$10^{10} L_{\odot}$]	1.21 ± 0.70	2.40 ± 0.83	0.04 ± 0.01	1.02 ± 0.37
		$L_{\text{yi}, \text{FUV}}$ [$10^{10} L_{\odot}$]	1.83 ± 0.60	0.71 ± 0.57	0.20 ± 0.04	0.36 ± 0.23
		M_{dust} [$10^7 M_{\odot}$]	18.0 ± 4.87	4.76 ± 0.98	1.68 ± 0.27	6.60 ± 1.64

Notes. ^(a)Bulge parameters: n is the Sérsic index, q is the intrinsic flattening factor, and R_e is the effective radius. ^(b)Disc parameters.

though we know that the dust evolves (e.g. Fitzpatrick & Massa 2007, 2009; Planck Collaboration I 2011; Planck Collaboration XXIV 2011; Liszt 2014a,b; Ysard et al. 2015; Reach et al. 2015, 2017a,b; Lenz et al. 2017; Nguyen et al. 2018), this is not taken into account in the current modelling. The dust around star forming regions is introduced in our model through subgrid models that rely on the MAPPINGS III SED templates for the young ionising stellar population (which account for the combined emission from H II regions and their surrounding PDRs).

To create the 3D distribution of the disc components we assigned to each of them an exponential profile of different scale heights, h_z , based on previous estimates of the vertical extent of edge-on galaxies (De Geyter et al. 2014). Then we generated a dust grid based on the dust component map through which the photons propagate in our simulations. For that purpose, a binary tree dust grid (Saftly et al. 2014) was employed with approximately 2.8 million dust cells for each galaxy.

Apart from the geometrical distribution, for each stellar component we assigned an intrinsic SED and a total luminosity, that is either fixed or a free parameter in the model. The different combinations of the free parameters generate a 3D radiative transfer simulation that takes into account the emission of the different stellar components as well as the absorption, scattering, and thermal re-emission by dust. The output of each simulation includes the SED of the galaxy and a set of broadband images that can directly be compared to the observed images. Additional information is also available: images of the galaxy at any viewing angles and any wavelengths can be retrieved, and most importantly the effects of the interaction between the ISRF and the diffuse dust can be studied in 3D. Global luminosities are distributed on the 3D pixels (voxels) according to the density distributions as prescribed by the physical maps. The $3.6\mu\text{m}$ luminosity of the old stellar population ($L_{\text{bulge+disc}, 3.6}$) was fixed a priori.

In Table 3 we list the main parameters that were used to model each galaxy. We distinguish between the parameters that were kept fixed and those that were left free. We left three parameters in our model free and they are determined via a χ^2 optimisation procedure. These parameters are the intrinsic FUV luminosity of the young non-ionising stellar population ($L_{\text{yni}, \text{FUV}}$), the intrinsic FUV luminosity of the young ionising

stellar population ($L_{\text{yi}, \text{FUV}}$), and the total dust mass (M_{dust}). In a similar fashion as in CIGALE, we added quadratically an extra 10% of the observed flux to the measured uncertainty, to account for systematic errors in the photometry and the models (Noll et al. 2009). For the free parameters we provide the initial guess values retrieved from global SED fitting with CIGALE, performed by Nersesian et al. (2019) for the DustPedia galaxies, as well as the best-fitting values retrieved from our simulations.

In order to determine the best-fitting model of each galaxy, we set up two batches of simulations. The first batch acts as an exploratory step of the parameter space. We first generated a broad parameter grid, considering 5 grid points for $L_{\text{yni}, \text{FUV}}$ and M_{dust} , and 7 grid points for $L_{\text{yi}, \text{FUV}}$. The choice of extending the range of $L_{\text{yi}, \text{FUV}}$ was made because of the difficulty to constrain this particular parameter (Viaene et al. 2017). We ran the first batch of simulations with a low-resolution wavelength grid of 115 wavelengths between 0.1 and $1000\mu\text{m}$, and without the requirement of spectral convolution of the simulated fluxes and images to the filter response curves. For each wavelength we used 10^6 photon packages, which was sufficient enough to reconstruct the global SEDs. In total, SKIRT created 175 simulated SEDs for each galaxy, and by directly comparing them with the observed SED we were able to narrow down the possible best-fitting parameter ranges. Based on those best-fitting values of the first batch, we generated a refined parameter grid space for the second batch of simulations.

For the second batch, we used a high-resolution wavelength grid (252 wavelength points) distributed in a non-uniform way over the entire UV-submm wavelength range. Furthermore, we used 5×10^6 photon packages per wavelength to ensure more accurate sampling of emission, extinction, and scattering, while we enabled spectral convolution. Despite the fact that we started the second batch of simulations with the same number of parameters for all galaxies –5 grid points for each free parameter–, in the cases of NGC 1365 and M 83, the expansion of the parameter space was necessary due to the difficulty in constraining the best-fitting values of $L_{\text{yi}, \text{FUV}}$ and $L_{\text{yni}, \text{FUV}}$, respectively. The number of simulations for the first and second batch are given in Table 4.

We ran our simulations on the high-performance cluster of Ghent University. For every galaxy here, each simulation of the

Table 4. Number of grid points for each free parameter ($L_{\text{yni, FUV}}$, $L_{\text{yi, FUV}}$ and M_{dust}), and for each batch of simulations.

Galaxy ID	Number of simulations		
	1st batch	2nd batch	Total
NGC 1365	$5 \times 7 \times 5 = 175$	$6 \times 8 \times 6 = 288$	463
M 83	$5 \times 7 \times 5 = 175$	$7 \times 5 \times 7 = 245$	420
M 95	$5 \times 7 \times 5 = 175$	$5 \times 5 \times 5 = 125$	300
M 100	$5 \times 7 \times 5 = 175$	$5 \times 5 \times 5 = 125$	300

Notes. The last column gives the total number of simulations we ran for each galaxy.

first batch consumes approximately 22 h of (single-core) CPU time, amounting to 15 400 CPU hours. For the second batch of high-resolution simulations, the average CPU time for each simulation is about 312 h. In total, all simulations together consumed about 26 CPU years.

4. Model validation

4.1. Global SEDs

We perform a series of quality checks on our results. The best simulated SEDs are shown in Fig. 2 along with the observed photometry derived from our pipeline. The total model SED is indicated by the black line, whereas the coloured lines represent the contribution of the different stellar components. We would like to point out that the dust emission of the individual SEDs does not add up to the total SED (black line), because the dependence of dust emission on the absorbed energy is non-linear. On the other hand, the sum of the (attenuated) stellar emission of each component equals the total stellar emission (black line). A weight was assigned to each filter depending on the wavelength regime that it belongs to (we define six regimes: UV, optical, NIR, MIR, FIR, and submm), such that each wavelength regime is equally important. Overall, and in all cases, the simulation agrees with the observations notably well within the uncertainties.

In all galaxies, a systematic deviation between model and observation is evident for the GALEX FUV and NUV bands, with the model always overestimating the FUV luminosity and underestimating the NUV luminosity. The most notable differences are around -0.12 dex for the GALEX FUV band of M 83 and 0.17 dex for the GALEX NUV band of M 95, while for M 100 there is an equal absolute deviation of 0.1 dex for both wavebands. The discrepancy between model and observation for the UV bands was also reported in the radiation transfer models of M 51 (De Looze et al. 2014), M 31 (Viaene et al. 2017), M 81 (Verstocken et al. 2020), and M 33 (Williams et al. 2019), as well as for edge-on galaxies (e.g. De Looze et al. 2012b,a; Mosenkov et al. 2016, 2018). UV bands are hard to fit because the SED in this spectral region depends sensitively on all the different components: the effects of dust extinction are more pronounced, the shape of the extinction curve is less well-determined and the shape of the intrinsic SEDs is very sensitive to the assumed population ages. Several studies have shown that age-selective attenuation may have a significant effect on the bump strength (Silva et al. 1998; Granato et al. 2000) at $0.22 \mu\text{m}$, characteristic of the dust attenuation. For example, the MAPPINGS III template seems to induce an inverse UV slope with respect to observations, making it very hard to accurately determine the age of the very young stellar populations. Another and

as-yet un-quantified uncertainty arises from THEMIS, which predicts that the UV extinction is sensitive to the a-C nano-particle population (Jones et al. 2013) and that this dust component varies with the local ISRF. These effects may result, in part, in the observed discrepancies in the UV bands (especially for the NUV band).

Another notable discrepancy seen in all galaxies, with the exception of M 95, is the overestimation of the 2MASS bands, with the worst fitted bands being: the 2MASS J for NGC 1365 with a difference of -0.18 dex, and 2MASS K_s for M 83 and M 100 with a difference of -0.2 dex and -0.13 dex, respectively. The 2MASS bands for those three galaxies are less sensitive to more diffuse emission and the 2MASS flux determination is therefore restricted to smaller regions, resulted in lower NIR flux density measurements. Furthermore, even though the predicted MIR-FIR luminosities are fitted by the models within the uncertainties, they fall short in relation to the observations in that wavelength range, especially for NGC 1365, which has a difference for the peak of the dust emission at $100 \mu\text{m}$ around 0.3 dex.

To obtain an estimate of the uncertainty for each one of the free parameters we build their probability distribution functions (PDFs). The probability is proportional to $\exp(-\chi^2/2)$. Figure 3 shows the PDFs of the free parameters from the second batch of simulations for all four galaxies. The best-fitted values are marked by a dashed red line, with the actual values given in Table 3. In all cases (except the $L_{\text{yni, FUV}}$ of NGC 1365), the best-fitted value is either the same as the most probable value of the parameter or it takes the second most probable value. For some parameters an asymmetric distribution is seen, for example in the $L_{\text{yni, FUV}}$ of M 83 and M 100 (values of $L_{\text{yni, FUV}}$ higher than the best-fitted value were also explored and have close to zero probability). The FUV emission of the young non-ionising stars dominates this particular region of the SED of M 83 and M 100 (blue curve in Fig. 2), leading to a better constraint on the $L_{\text{yni, FUV}}$ parameter. On the other hand, the $L_{\text{yni, FUV}}$ of M 95 has a flat distribution, leading to a poor constraint on the parameter. The PDFs of the parameters that resemble a normal distribution suggest that the parameters are constrained fairly well.

Overall, the two fitted luminosities always end up being below the initial guess, while the dust mass always ends up being higher. To be more specific, despite the fact that the best-fitted values of the $L_{\text{yi, FUV}}$ are below the initial guess, they are still comparable with the initial guess values (marginally within the uncertainties, with M 100 as the only exception), while the best-fitted values of the $L_{\text{yni, FUV}}$ take much lower values than the initial guess. The lower FUV emission from the young non-ionising stellar population could partially explain the lower MIR-FIR emission in the final SED models. The most notable difference between the best-fitted and initial guess values is the total dust mass, where the best-fitted value for all galaxies is approximately two times larger than the one derived by CIGALE.

4.2. Image comparison

Another way to validate our results and understand the discrepancies in the integrated luminosities shown in Fig. 2, is to compare model and observations at spatially resolved scales. Figure 4 shows a selection of representative wavebands across the spectrum of M 83 (similar comparisons for the other three galaxies are provided in the Appendix B). The bands were selected to demonstrate how well the model reproduces the observed images across the different wavelength regimes (from top to bottom: UV, optical, NIR, MIR, FIR, submm). The most

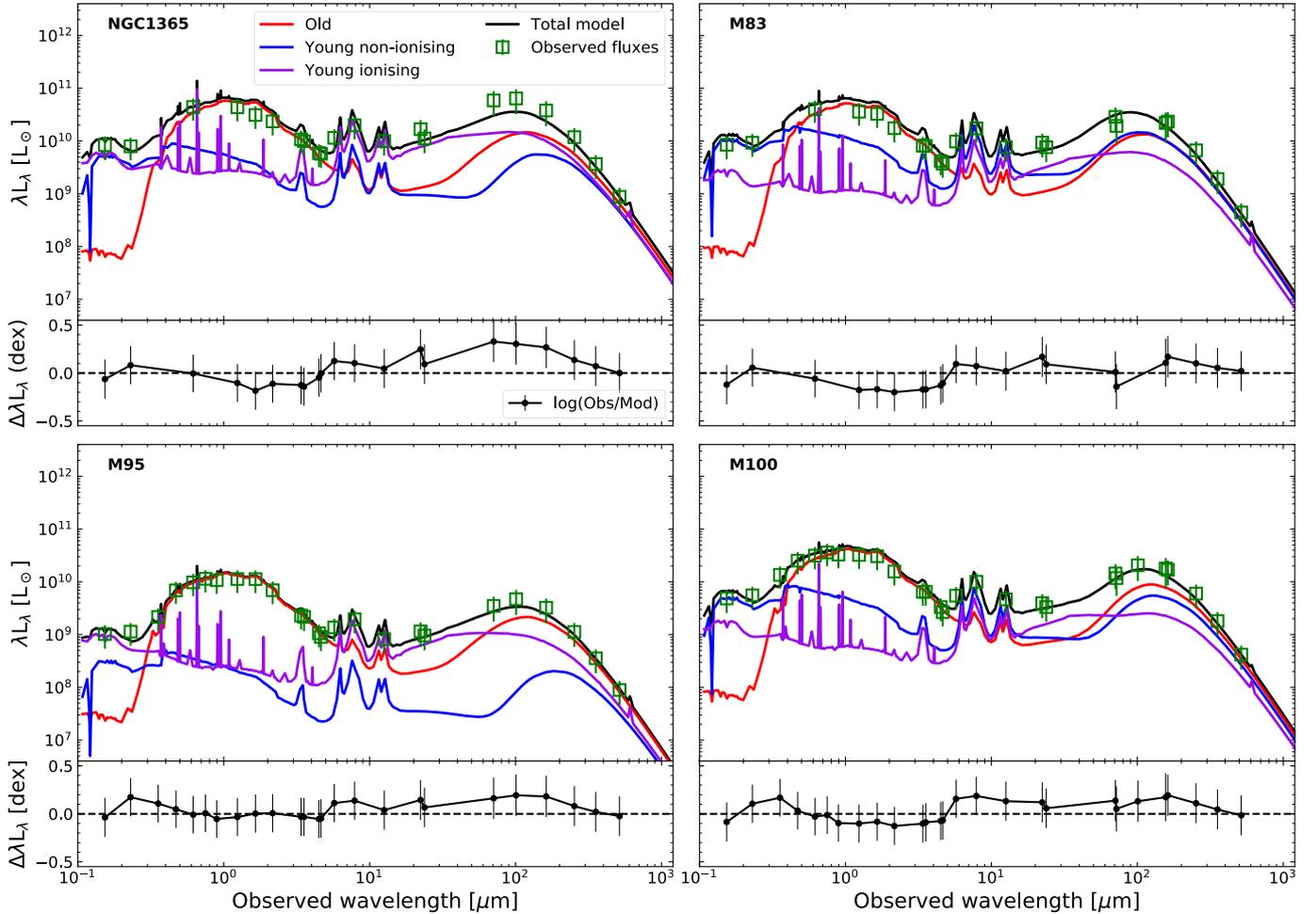


Fig. 2. *Top panel of each sub-figure:* panchromatic SED of the respective galaxy. The black line is the best-fitting radiative transfer model, run at high-resolution. The green square points are the observed integrated luminosities measured for each galaxy (see Table A.1). The red, blue, and violet lines represent the SEDs for simulations with only one stellar component: old, young non-ionising, and young ionising stellar population, respectively. The interstellar dust component is still present in these simulations. *Bottom panel of each sub-figure:* difference in dex between the observations and the best-fitting model.

efficient way to visualise any difference between observations (first column) and simulations (second column) is by computing a residual image (third column),

$$\text{residual} = 100 \times \left(\frac{\text{observation} - \text{model}}{\text{observation}} \right) \% . \quad (1)$$

Positive values (in red) mean that the model underestimates the observed emission. On the other hand, negative values (in blue) mean that the model overestimates the observations. The fourth column of Fig. 4 shows a kernel density estimation (KDE) of the residual values, normalised to 1 at the peak. Overall, there is a good agreement between model and observations for M 83, with the majority of the model pixels within 50% of their observed counterpart. At this point, we stress that the model images are not directly used in the optimisation procedure (we only fit to the measured global fluxes).

In detail, the FUV emission in the model of M 83 compares quite well with the observations, with the majority of the pixel residuals being near 0%. However, the model overestimates the FUV emission across the spiral arms and bar region, with residuals lower than -50% , whereas it underestimates the FUV emission in the central and star-forming regions (red points within the spiral arms). As mentioned in Sect. 4.1, there is a certain challenge modelling the UV bands because all the different

components (stellar and dust) affect, in one way or another, the total emission we observe.

A very good match between model and observation is seen for the optical image in the R_C band. The model is an accurate representation of the observed image, with very few residuals below -50% in the spiral arms, and few positive residuals at the edges of the image due to low S/N. The IRAC $3.6\mu\text{m}$ residual map shows a smooth distribution without many sharp features, with deviations remaining mostly within the spiral arms and partially in the inter-arm regions (i.e. the model overestimates the observations, with the peak of the distribution of the residual values being around 40%). This somewhat confirms that the old stellar component in our radiation transfer simulations represents the old stellar population adequately. Interestingly enough, the pixel residuals for all three galaxies with high star-formation activity (M 83, NGC 1365, and M 100) display a systematic offset, with the model predicting higher emission despite the fact that we directly determine the normalisation of the old stellar component from the IRAC $3.6\mu\text{m}$ band (see the IRAC $3.6\mu\text{m}$ image comparison in Figs. 4, B.1, and B.3). In the 3D model of M 51 (De Looze et al. 2014), a similar offset was observed with the model predicting lower values for that band instead. On the other hand, in the 3D models of low star-forming galaxies like M 95 (see the IRAC $3.6\mu\text{m}$ image comparison in Fig. B.2), M 81

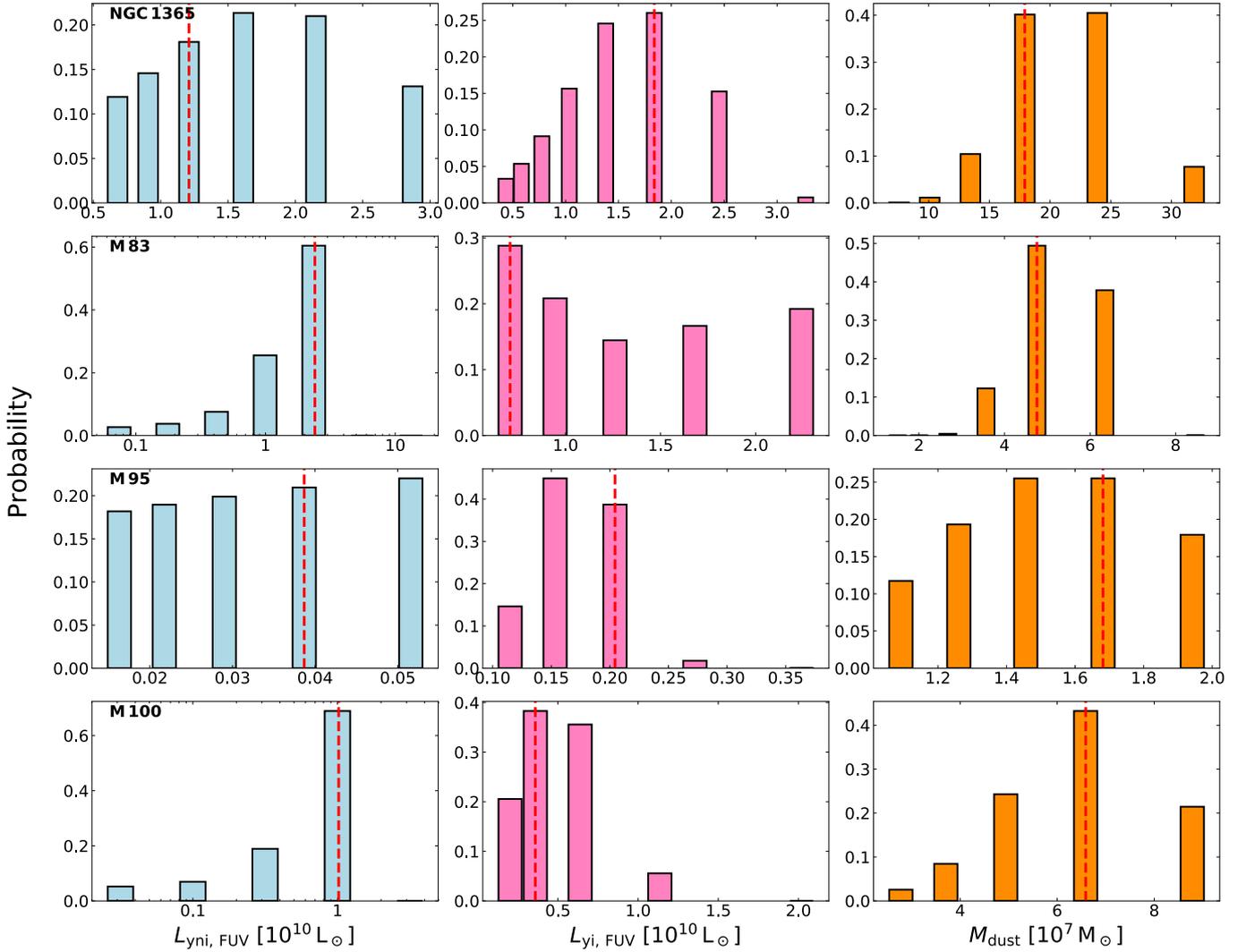


Fig. 3. PDFs of the three free parameters in our model optimisation: the intrinsic FUV luminosity from the young non-ionising stellar component, $L_{\text{yni, FUV}}$ (left), the intrinsic FUV luminosity from the young ionising stellar component, $L_{\text{yi, FUV}}$ (middle), and the total dust mass, M_{dust} (right). Dashed red lines are the parameter values for the best-fitting model.

(Verstocken et al. 2020), M 31 (Viaene et al. 2017), and M 33 (Williams et al. 2019), model and observations are in excellent agreement. The excess $3.6\mu\text{m}$ emission may arise from young stars in the spiral arms that contribute light even at these wavelengths. There may also be a contribution from aromatic features emitting at this wavelength. Together these contaminants can explain the differences between model and observations.

Moving on to the MIR, FIR, and submm regimes, simulated images and observations are in good agreement, with residual values having a narrow distribution peaking within $\pm 20\%$. The residual map of MIPS $24\mu\text{m}$ exhibits some strong features indicative of the contributions by hot dust and aromatic features of clumpy areas in the outer regions of the spiral arms. In the cases of Photodetector Array Camera and Spectrometer (PACS; Poglitsch et al. 2010) $160\mu\text{m}$ and the Spectral and Photometric Imaging REceiver (SPIRE; Griffin et al. 2010) $350\mu\text{m}$ wavebands, the model underestimates the dust emission mainly in the spiral arms and bar region, with the diffuse dust in the inter-arm regions accurately being represented in our model.

In addition, when we try to understand the differences between simulations and observations, we need to take into consideration several effects that could potentially increase the level

of the observed residuals in Figs. 4, B.1–B.3. First, the appearance of a significant level of residuals can be attributed to deprojection effects. Due to the deprojection procedure, the brightest regions are smeared out in the direction of deprojection. Then the light is smeared out in the vertical direction creating a blurring-like effect (for example, see the FUV and R_c model images in Figs. 4, B.1, and B.3). Another cause, responsible for a substantial fraction of residuals, is the fact that we combine multiple images, of different resolutions, to generate the input maps of the stellar and dust components in our models. Simulated images thus have a complex point spread function (PSF) and are not convolved by a single beam, in contrast with observed images.

Finally, a certain degree of difficulty exists when modelling the star-forming regions in detail which probably adds up to the observed discrepancies. For star-forming regions, a spherical shell geometry and an isotropic emission is implemented here. Those models result in a higher level of attenuation per unit dust mass than other models where a clumpy or asymmetric geometry is assumed (Witt & Gordon 1996, 2000; Városi & Dwek 1999; Indebetouw et al. 2006; Whelan et al. 2011). Of course the effect described here is more pronounced in the UV regime, where the young ionising stars are relatively more luminous.

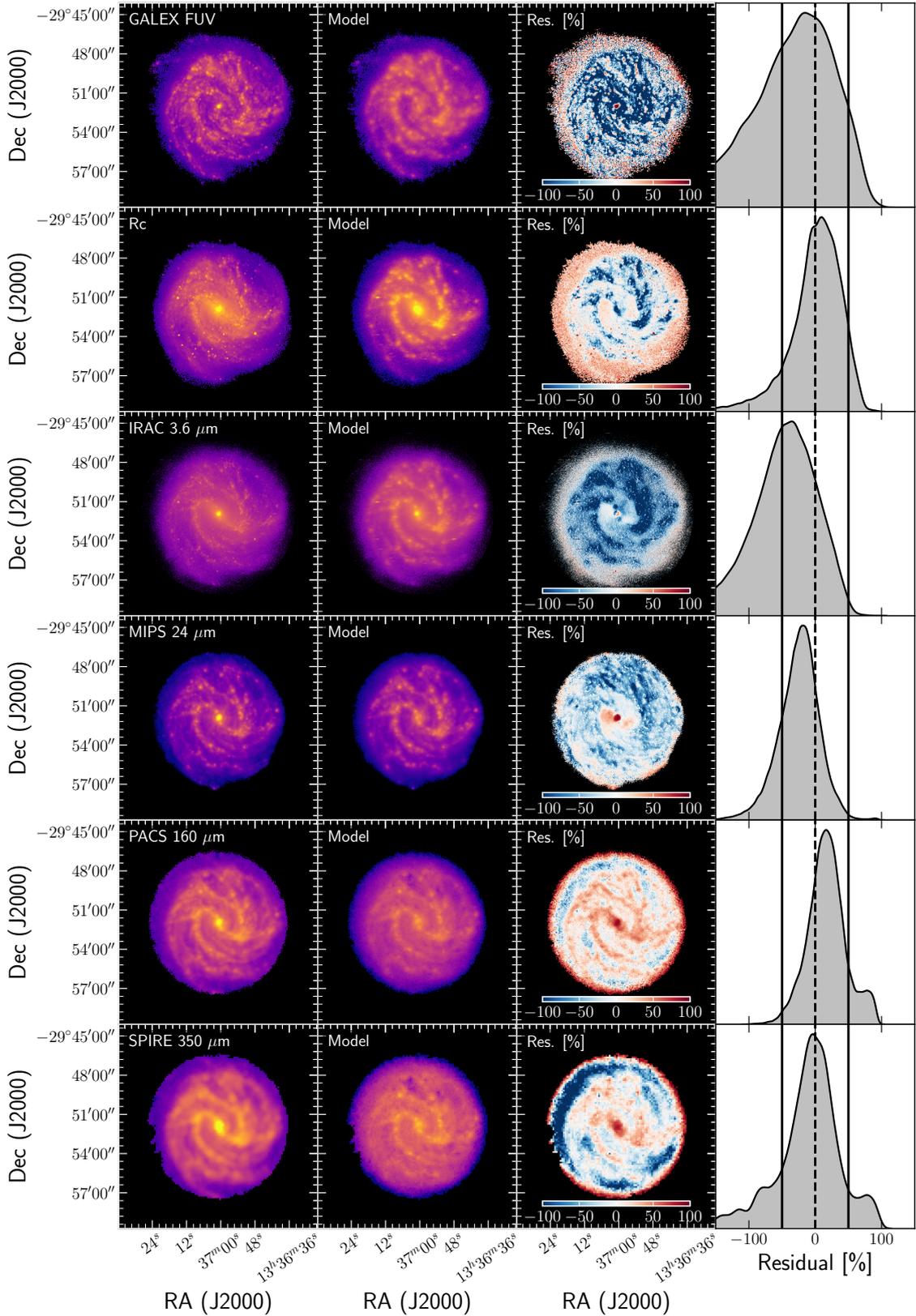


Fig. 4. Comparison of the simulated images with observations in selected wavebands for M 83. *First column:* observed images, *second column:* simulated images, *third column:* maps of the relative residuals between observed and simulated images, and *last column:* KDE of the distributions of the residual pixel values. The simulated images have the same pixel mask as the observed images. The colour coding of the *first two columns* is in log scale and reflects a normalised flux density. The selected wavebands are: GALEX FUV, R_c , IRAC 3.6 μm , MIPS 24 μm , PACS 160 μm , and SPIRE 350 μm .

5. Discussion

5.1. Attenuation law

An important caveat in SED fitting codes is the use of idealised attenuation curves, converted from extinction laws that do not fully incorporate the effect of the relative geometries expected to be found between dust and stars. In a recent effort to address this caveat, [Buat et al. \(2018\)](#) measured the shape of the attenuation curves of star-forming galaxies by employing two different recipes: a flexible Calzetti attenuation law ([Noll et al. 2009](#)) and a two power-law recipe based on the one inferred by [Charlot & Fall \(2000\)](#). Both recipes take the shape of the attenuation curve and the relative attenuation of young and old stellar populations as free parameters. [Buat et al. \(2018\)](#) found that the [Charlot & Fall \(2000\)](#) recipe is able to better reproduce the results from radiative transfer models, and [Buat et al. \(2019\)](#) proposed a new modified Calzetti attenuation law with that specific goal in mind. From our radiative transfer simulations we can shed light on the impact of the relative geometry between the different stellar populations and the diffuse dust to the observed galaxy SEDs by reconstructing realistic dust attenuation curves. In order to determine the global attenuation curves we use the observed SED of the best-fitting model and the stellar spectrum we reconstruct for each galaxy. In Fig. 5 we present the attenuation curves of the galaxies in our sample, derived from the 3D modelling with SKIRT. A face-on orientation (inclination angle 0°) was assumed for all galaxies. We complement the attenuation curves with those derived for M 81 from [Verstocken et al. \(2020\)](#) and M 77 from [Viaene et al. \(2020\)](#). The attenuation curves of NGC 1365, M 83, M 95, M 100, M 81, and M 77 have been normalised to the V-band attenuation by: 0.27, 0.47, 0.22, 0.32, 0.09, and 1.03, respectively. We find a steep increase of attenuation towards the UV wavelengths due to absorption by small grains. A broad absorption bump is also evident with a peak around $0.22 \mu\text{m}$. The values of the V-band attenuation indicate that the galactic discs are optically thin if galaxies were to be seen face-on. This explains the steeper slopes in the UV wavelengths and the stronger $0.22 \mu\text{m}$ bumps in relation to the normalised THEMIS extinction curve ([Witt & Gordon 2000](#)).

The observed curves are the combination of the attenuation by diffuse dust as modelled by the dust mass input map, and the attenuation by dust in star-forming regions. The dust in the star-forming clouds is incorporated in the MAPPINGS III SED templates ([Groves et al. 2008](#)), which were used to represent the ionising stellar component. The MAPPINGS III attenuation law is directly provided by [Groves et al. \(2008\)](#), while the diffuse dust attenuation curve is a combination of the THEMIS extinction law ([Jones et al. 2013, 2017; Köhler et al. 2014](#)) and the relative geometry between stars and dust. In Fig. 5, we also plot the extinction curve of the THEMIS dust model (solid black line), which was used in all six studied galaxies. In addition, for comparison purposes, we provide literature measurements of the extinction law for the Small Magellanic Cloud (SMC) bar region from [Gordon et al. \(2003\)](#) (dotted black line), and the attenuation law of starburst galaxies from [Calzetti et al. \(2000\)](#) (dashed black line). Moreover, we show the median values of the sSFR for every galaxy in increasing order derived from our simulations (see Sect. 5.3 on how we compute the sSFR).

At optical and NIR wavelengths ($\lambda \geq 0.4 \mu\text{m}$) all attenuation curves are in agreement, but this is expected since we normalised them with the V-band. At shorter wavelengths ($\lambda < 0.4 \mu\text{m}$), the curves begin to diverge. The UV bump in all six galaxies covers quite an extended range, with the peak of the bump varying over 2 orders of magnitude, despite the fact that all galaxies

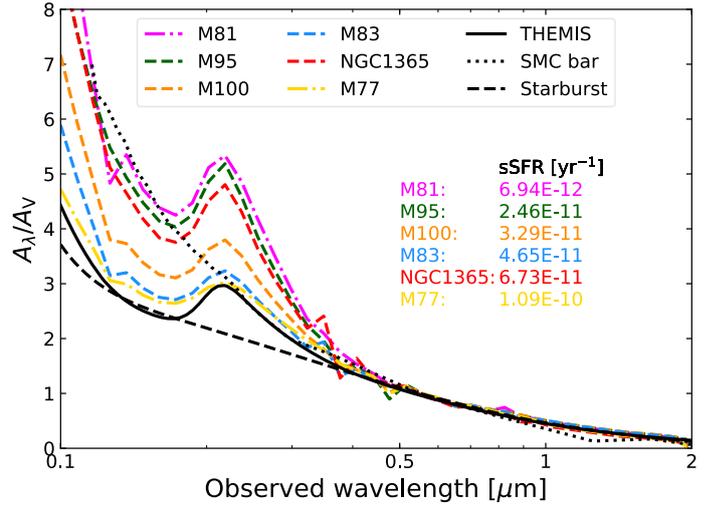


Fig. 5. Compilation of attenuation laws derived from our models on a face-on view (0° inclination angle), normalised to the V-band attenuation. In addition to the attenuation curves derived for the galaxy sample of this study, we provide the attenuation curves of M 81 from [Verstocken et al. \(2020\)](#), and M 77 from [Viaene et al. \(2020\)](#). Several literature measurements are shown as well: solid black line: THEMIS extinction law ([Jones et al. 2013, 2017; Köhler et al. 2014](#)), dotted black line: extinction curve of SMC bar ([Gordon et al. 2003](#)), dashed black line: attenuation law of starburst galaxies ([Calzetti et al. 2000](#)). The median values of the sSFR for every galaxy is also given in increasing order, as derived from our simulations.

in our collective study share the exact same grain properties (i.e. the THEMIS extinction curve for the standard MW case was used in every model). The diversity of the bump strength can be linked directly to the sSFR (a measure of the current to past star formation in galaxies) of each system ([Kriek & Conroy 2013; Reddy et al. 2015](#)). A weakened UV bump implies that an extra amount of radiation is filling in the bump either by UV photons from unobscured young stars or by light scattered into the line of sight ([Narayanan et al. 2018](#)). Of course, a reduced UV bump can also arise from opposing processes: intense UV radiation destroying the carriers in low density regions, and the bump carriers accreting onto big grains in high density regions, however these processes are not incorporated in the model so they cannot explain the differences in the attenuation curves.

With the exception of NGC 1365, we find a correlation between the sSFR and the shape of the attenuation curve, suggesting an age-dependent extinction curve. M 81 and M 95, two low sSFR galaxies exhibit a strong, almost identical UV bump, whereas galaxies of higher sSFR, for example M 83 and M 77, have a weaker UV bump. Contrarily, NGC 1365, a galaxy of high sSFR, presents a strong bump similar to M 81 and M 95. This behaviour suggests that most of the UV light emitted in the star-forming regions of NGC 1365 is heavily obscured by dust resulting in the strong bump feature we observe here. Another notable result is the presence of a UV bump in all attenuation curves, despite the claims made by some other authors in the past that bump-free attenuation curves, such as the [Calzetti et al. \(2000\)](#) curve, could arise even with dust that has a normal UV bump in the extinction curve. We confirm that as long as the UV bump in the extinction curve is represented as a true absorption feature, the corresponding attenuation laws must have a bump, although it may appear weakened.

Beyond the UV bump, our model curves steadily increase and fall somewhere between the starburst idealised attenuation

law and the SMC extinction curve. It is interesting to notice here that stronger bumps seem to sit on steeper slopes. This result is well known and is attributed to the star-dust geometry (Witt & Gordon 1996; Narayanan et al. 2018). Narayanan et al. (2018) have shown that steeper slopes may arise either by a large fraction of obscured young stars or by a significant fraction of unobscured old stars. Consequently, galaxies with older stellar populations exhibit steeper attenuation curves. On the other hand, flatter attenuation curves are the result of a more complex geometry where more of the starlight is decoupled from dust. Based on our results we hereby confirm that galaxies of high sSFR values have shallower attenuation curves and weaker UV bumps.

5.2. Dust heating

A relevant quantity that holds information about the stellar energy absorbed by dust in a galaxy, and that is based on the assumption of energy balance, is the fraction of dust to bolometric luminosity (dust-heating fraction). Bianchi et al. (2018) defined this quantity as f_{abs} . With the use of radiative transfer modelling we can calculate this quantity not only on global scales but also on local scales. On global scales the dust-heating fraction is:

$$f_{\text{abs}}^{\text{SKIRT}} = \frac{L_{\text{dust}}}{L_{\text{stars}} + L_{\text{dust}}}, \quad (2)$$

where L_{stars} is the observed stellar emission and L_{dust} is the total dust luminosity, computed by integrating the SEDs presented in Fig. 2. For each galaxy we have calculated $f_{\text{abs}}^{\text{SKIRT}}$ and we have compared them with $f_{\text{abs}}^{\text{CIGALE}}$ produced in Bianchi et al. (2018) (see Table 5). The $f_{\text{abs}}^{\text{SKIRT}}$ fractions we obtain are slightly lower than, but compatible with, those obtained by Bianchi et al. (2018). In Bianchi et al. (2018) the authors provide the mean $f_{\text{abs}}^{\text{CIGALE}}$ values for 814 DustPedia galaxies, divided into 6 groups, according to their morphology classification (Hubble stage, T). The mean $f_{\text{abs}}^{\text{CIGALE}}$ value of the corresponding morphological bin (Sb-Sc; $2.5 \leq T < 5.5$) that our galaxy sample falls into is $32.8 \pm 13.9\%$. This value is in very good agreement with the mean value of $f_{\text{abs}}^{\text{SKIRT}}$ ($36.5 \pm 7.4\%$) of the rather small group of galaxies in our study. In any case, our modelling gives us the opportunity to better characterise which stellar population is the dominant dust-heating source in each galaxy, and how significant the contribution of old stars is, on a spatially resolved manner.

From our simulations it is possible to retrieve the absorbed energy in each dust cell (originating from the different stellar populations in the model), and thus to quantify the dust-heating fraction from the young non-ionising and young ionising stellar populations (hereafter, we will refer to the heating fraction by the young non-ionising and young ionising stellar populations simply as young heating fraction or f_{young}). We obtain the young heating fraction through:

$$f_{\text{young}} = \frac{L_{\text{yni}}^{\text{abs}} + L_{\text{yi}}^{\text{abs}}}{L_{\text{total}}^{\text{abs}}}. \quad (3)$$

where $L_{\text{yni}}^{\text{abs}}$ and $L_{\text{yi}}^{\text{abs}}$ are the luminosities of the young non-ionising and young ionising stellar populations absorbed by dust, respectively, and $L_{\text{total}}^{\text{abs}}$ is the total stellar luminosity absorbed by dust.

In Fig. 6, the left panel of each sub-figure shows the dust-heating map of the face-on view of each galaxy. The bulge and bar regions are denoted with a solid red circle and a dashed

Table 5. $f_{\text{abs}}^{\text{SKIRT}}$, $f_{\text{abs}}^{\text{CIGALE}}$ (Bianchi et al. 2018), and the mean global f_{young} , as well as the mean f_{young} in the bulge and bar region.

Galaxy ID	$f_{\text{abs}}^{\text{SKIRT}}$ [%]	$f_{\text{abs}}^{\text{CIGALE}}$ [%]	f_{young} [%]		
			Global	Bulge	Bar
NGC 1365	44	53 ± 21	68 ± 15	40 ± 14	66 ± 13
M 83	43	53 ± 9	64 ± 15	32 ± 12	59 ± 12
M 95	26	28 ± 4	47 ± 16	46 ± 12	43 ± 17
M 100	33	38 ± 4	57 ± 13	34 ± 12	46 ± 12

Notes. The regions are defined in Fig. 6 with a solid red circle and a dashed blue ellipse, respectively.

blue ellipse, respectively. The parameters used to define these regions were retrieved from the S⁴G database (Salo et al. 2015). We define the bulge radius as $2 \times R_{\text{e}}$. Salo et al. (2015) used a modified Ferrers profile to model the bar. The histogram in the right panel of each sub-figure displays the young heating fraction distribution within the dust cells, weighted by the dust mass. For NGC 1365 we find that on average, 68% of the dust heating (or dust emission) originates from the radiation produced by the young stellar populations. M 83 shows also a high f_{young} with a mean value of 64%, while in the cases of M 95 and M 100 the young and old stellar populations contribute approximately to one half each, with mean young heating fractions around 47% and 57%, respectively. However, in the case of M 95 the mode of the distribution is shifted to a much lower value (~37%) compared to the mean and median values. From the dust-heating maps of NGC 1365, M 83, and M 100 we can see that the star formation is for the most part concentrated in the spiral arms. In the case of M 95 the bulk of the dust is heated by the old stellar population, with few sites of star formation remaining in the circumnuclear ring and in the outer ring of molecular gas that surrounds the stellar bar.

We find that the mean f_{young} within the bulge region of every galaxy does not exceed ~46% (see Table 5). As expected, the old stellar population is the dominant dust-heating source in the central region of each galaxy (see also, De Looze et al. 2014; Viaene et al. 2017; Verstocken et al. 2020). Regarding the bar, although we do not treat the bar of each galaxy as a different component in our modelling, we can still extract basic information of its properties by looking at the young heating fraction, the radial profiles (see Fig. 7) and the dust temperature (see Sect. 5.4). In the bar region, the mean young heating fractions are: ~66%, ~59%, ~43%, and ~46% for NGC 1365, M 83, M 95, and M 100 respectively, with the higher value being for the galaxy with the longest bar (NGC 1365; bar length of 24 kpc), while the lower value being for the galaxy with the shorter bar (M 95; bar length of 7 kpc). These fractions imply that the radiation field in the bar is caused by a mix of old and young stellar populations, both “equally” contributing to the dust heating. The young heating fractions for every galaxy and each region are given in Table 5.

Furthermore, Fig. 7 depicts the radial profiles of the young heating fractions. Each point represents a dust cell in our simulations. Following the running median (dashed black line) an interesting pattern appears. It is immediately evident, that all galaxies showcase a narrow central peak where the bulge region ends and the bar starts. This peak is followed by a local minimum in the young heating fraction and then an outer maximum which interestingly coincides with the bar truncation point. Then, the running median of f_{young} in the galactic disc slowly declines or remains constant. This pattern is clearer for M 95

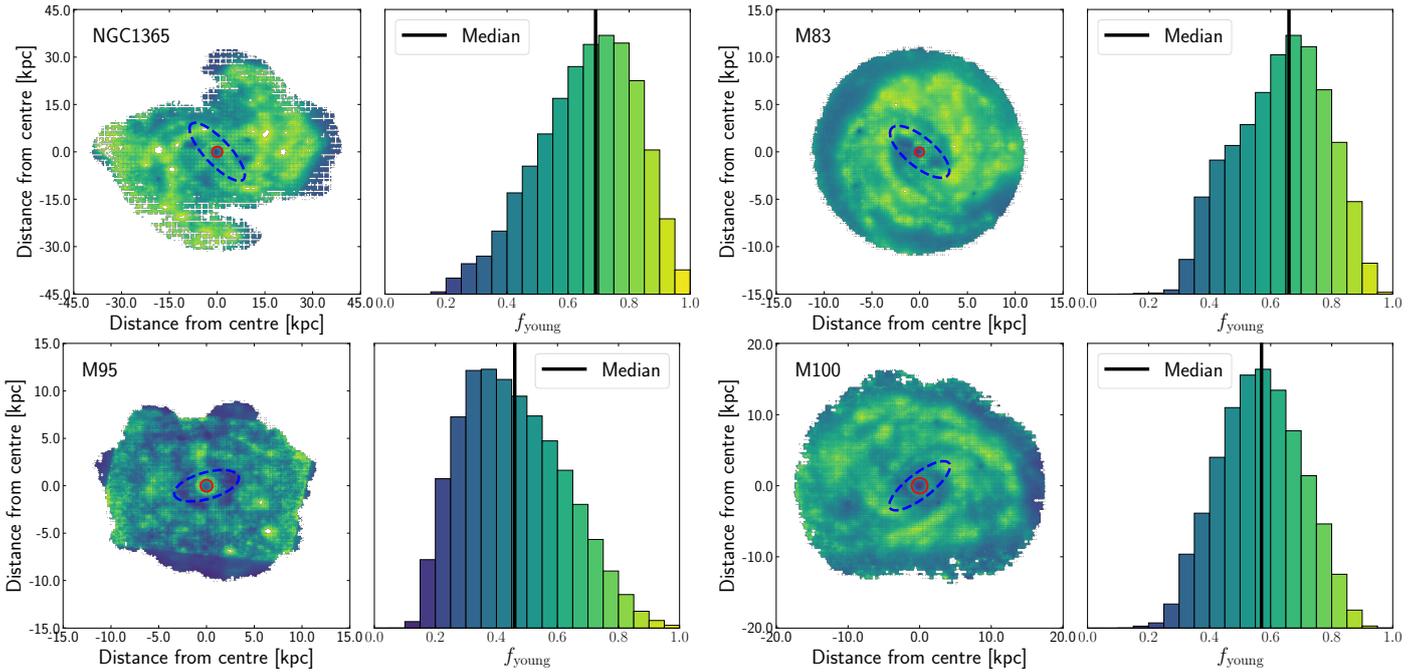


Fig. 6. *Left panel of each sub-figure:* face-on view of the heating fraction by young non-ionising and young ionising stellar populations (Eq. (3)), as obtained from the 3D dust cell distribution, for each galaxy. The bulge region of every galaxy is indicated with a solid red circle and the bar region with a dashed blue ellipse (see text for more details). *Right panel of each sub-figure:* distribution of the dust cell heating fractions, weighted by dust mass. The histogram also denotes the colour coding of the map on the left. The solid black line shows the median value.

with a strong peak at 1 kpc distance, possibly due to the nuclear starburst and the inner star-forming ring that connects the bulge with the bar. Moreover, M 95 reaches a second minimum in the bar inner region indicating the suppression of star formation due to gas depletion or gas re-distribution. For example, James et al. (2009) have shown the lack of $H\alpha$ emission in the bar region of M 95, and long-slit spectroscopy showed that any diffuse emission from that region is associated with post-AGB (Asymptotic Giant Branch) stars (James & Percival 2015). In a recent study, George et al. (2019) presented evidence of suppressed star formation in the bar inner region of M 95 due to gas inflows to the nuclear region. On the other hand, the pattern we describe here is less prominent in the case of NGC 1365 possibly due to the enhanced star-forming activity close to the central area (Fazeli et al. 2019), but also due to the higher levels of star formation in the bar inner region.

James et al. (2009) reported the same pattern while studying the effects of bars on the radial distributions of $H\alpha$ and R-band light for more than 300 nearby galaxies. James et al. (2009) have shown (see their Fig. 8) that the mean $H\alpha$ profiles (tracing the SFR) for galaxies with a clear optical bar and of Hubble stages T , between 3 and 5, have the same visible pattern as the one we observe here. They concluded as we do, that the bar component is responsible for the distinctive profiles seen in Fig. 7, since a similar pattern is absent in the radial profiles of unbarred galaxies (for example, see the radial profile of M 81; Verstocken et al. 2020).

In summary, our analysis indicates that the central regions and the two diametrically opposed ends of the bar are places of enhanced star formation while the bar inner region is mostly populated by more evolved stars. Even though the galaxy sample studied here is too small for any formal statistical analysis, we can confirm that bars have a clear effect on the variation of the f_{young} radial profile. Of course, bars are not axisymmetric and therefore any effect caused by them will only arise in a diluted

form, in any of the radial profiles. Furthermore, a dynamical origin of the presence of low-age stars in the bar central and outer regions cannot be excluded. Wozniak (2007) have shown that the regions of enhanced star formation inside the bar are due to the accumulation of young stellar populations trapped on elliptical-like orbits along the bar. In any case, the distinct bar-induced features in the young heating fraction profiles suggest that the bars are prompting star formation that would not otherwise be happening (James et al. 2009).

5.3. Correlation between young heating fraction and sSFR

In this section we report a strong relation between the young heating fraction and the sSFR. According to Ciesla et al. (2014), sSFR is a measure of the hardness of the UV radiation field, providing an interesting and unique insight on the ratio of the current over the past star-forming activity of a galaxy. De Looze et al. (2014) have shown the existence of a strong correlation between the sSFR and the dust mass fraction heated by the young stellar populations for M 51. This correlation was further confirmed in the radiation transfer models of M 31 (Viaene et al. 2017) and M 81 (Verstocken et al. 2020). Radiation transfer models aside, others have found the same relationship at both local galaxy samples (Viaene et al. 2016; Nersesian et al. 2019) and intermediate redshift (z) galaxies (Leja et al. 2019).

Figure 8 shows the relative contribution from the young stellar populations to the dust heating responsible for the TIR emission as was calculated for each dust cell and for all four galaxies of this study, as a function of \log sSFR. Additionally, we include the data of the radiation transfer models of M 77 (Viaene et al. 2020) and M 81 (Verstocken et al. 2020). In total, the plot of Fig. 8 contains more than 15 million data points. To estimate the stellar masses we used the IRAC $3.6\ \mu\text{m}$ luminosities and the prescription provided by Oliver et al. (2010). We converted the intrinsic FUV luminosity of the young stellar populations to SFR