# Deriving a multivariate $\alpha_{CO}$ conversion function using the [C II]/CO (1-0) ratio and its application to molecular gas scaling relations

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### ABSTRACT

We present Herschel PACS observations of the [C II] 158 µm emission line in a sample of 24 intermediate mass (9 < log  $M_*/M_{\odot}$  < 10) and low metallicity (0.4 < Z/Z\_{\odot} < 1.0) galaxies from the xCOLD GASS survey. In combination with IRAM CO (1-0) measurements, we establish scaling relations between integrated and molecular region  $L_{\rm [C\,II]}/L_{\rm CO\,(1-0)}$  ratios as a function of integrated galaxy properties. A Bayesian analysis reveals that only two parameters, metallicity and offset from the main sequence,  $\Delta(MS)$ , are needed to quantify variations in the luminosity ratio; metallicity describes the total dust content available to shield CO from UV radiation, while  $\Delta(MS)$  describes the strength of this radiation field. We connect the  $L_{\rm [C\,II]}/L_{\rm CO(1-0)}$  ratio to the CO-to-H<sub>2</sub> conversion factor and find a multivariate conversion function, which can be used up to  $z \sim 2.5$ . This function depends primarily on metallicity, with a second-order dependence on  $\Delta$ (MS). We apply this to the full xCOLD GASS and PHIBSS1 surveys and investigate molecular gas scaling relations. We find a flattening of the relation between gas mass fraction and stellar mass at  $\log M_* < 10.0$ . While the molecular gas depletion time varies with sSFR, it is mostly independent of mass, indicating that the low  $L_{\rm CO}$ /SFR ratios long observed in low-mass galaxies are entirely due to photodissociation of CO and not to an enhanced star formation efficiency.

**Key words:** surveys – galaxies: evolution – galaxies: fundamental parameters – galaxies: ISM – radio lines: galaxies.

# **1 INTRODUCTION**

Observations of the cold interstellar medium (ISM) of normal starforming galaxies at low and high redshifts have recently helped to establish an 'equilibrium model' for galaxy evolution. Under this framework, galaxy growth is controlled by the total available gas reservoir through the interplay of gas inflows and outflows, and the efficiency of the star formation process (e.g. White & Frenk 1991; Bouché et al. 2010; Davé, Finlator & Oppenheimer 2012; Lilly et al. 2013). Trying to understand what triggers and drives star formation, how the chemical enrichment of the ISM proceeds, and what

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causes the growth of galaxies is intricately linked to understanding their total gas content. Being able to measure the amount and properties of cold gas in a very wide range of galaxies is therefore of great importance to further our understanding of galaxy evolution.

It has been well established that most star formation in the Milky Way and nearby galaxies occurs in dense giant molecular clouds (GMCs), and that most of this molecular gas is in the form of cold H<sub>2</sub> (e.g. Solomon et al. 1987; Young & Scoville 1991; Leroy et al. 2008; Kennicutt & Evans 2012). However, with the molecule lacking a permanent electric dipole moment, cold H<sub>2</sub> is not directly observable, and it is common practice to instead trace cold molecular gas through the low-lying rotational transitions of the second most abundant molecule, <sup>12</sup>CO (Scoville 2013). The ground rotational transition of CO has a low excitation temperature, 5.53 K, and a low critical density, 700 cm<sup>-3</sup>, making it easily excited in cold molecular clouds (Dickman, Snell & Schloerb 1986). At a wavelength of 2.6 mm the ground state falls within the Earth's atmospheric window allowing it to be easily observed from ground based facilities. Given all this, it has become the workhorse tracer to quantify the total molecular gas reservoir in galaxies both near and distant (Bolatto, Wolfire & Leroy 2013).

Although the CO rotational transitions are optically thick in typical conditions, the information on the total molecular gas mass is contained in the width of the line under the assumption that GMCs are virialized and that the line emission is the superposition of a number of such virialized clouds. The correlation between the velocity-integrated line luminosity  $L'_{CO}$  in the  $1 \rightarrow 0$  transition and the total molecular gas mass is given by the empirical relation (Dickman et al. 1986; Obreschkow & Rawlings 2009):

$$M_{\rm H_2} = \alpha_{\rm CO} L_{\rm CO(1-0)}^{'}.$$
 (1)

Here,  $M_{\rm H_2}$  has units of M<sub> $\odot$ </sub> and  $L'_{\rm CO(1-0)}$  (K km s<sup>-1</sup> pc<sup>2</sup>), the integrated line luminosity, is related to the observed velocity integrated flux density,  $I_{\rm CO}\Delta v$  (Jy km s<sup>-1</sup>), following Solomon et al. (1997):

$$L'_{\rm CO(1-0)} = 3.25 \times 10^7 I_{\rm CO} \Delta v v_{\rm obs}^{-2} D_{\rm L}^2 (1+z)^{-3}, \qquad (2)$$

where the frequency is in GHz and the luminosity distance,  $D_{\rm L}$ , is in Mpc. Thus  $\alpha_{\rm CO}$ , the CO-to-H<sub>2</sub> conversion factor, can be considered a mass-to-light ratio. Across observations of the Milky Way and nearby star-forming galaxies with approximately solar metallicities, the empirical CO (1–0) conversion factors are consistent with a typically value of 4.36 M<sub> $\odot$ </sub> (K km s<sup>-1</sup>)<sup>-1</sup>, which includes a 36 per cent correction for helium gas (Strong & Mattox 1996; Abdo et al. 2010).

However, CO has been difficult to detect in local low-mass galaxies. Sensitivity has limited CO detections to galaxies with  $Z/Z_{\odot} \ge 0.1$  (Leroy et al. 2009; Schruba et al. 2012; Rémy-Ruyer et al. 2014). Does this mean that galaxies with even lower metallicities have very little molecular gas, or does CO become a poor tracer of the molecular ISM in low metallicity conditions? Indeed, there is strong evidence that not all of the H<sub>2</sub> is traced by CO emission; UV radiation from massive stars destroys CO to a cloud depth of a few  $A_V$ , which can correspond to a significant fraction of the total gas column in low metallicity clouds (van Dishoeck & Black 1986; Wolfire, Hollenbach & McKee 2010). While H<sub>2</sub> is self-shielded from this UV radiation, CO relies on dust shielding and therefore, in low metallicity star-forming galaxies which have hard radiation fields and lower dust-to-gas mass ratios, CO is easily photodissociated into C<sup>+</sup> and O (Poglitsch et al. 1995; Röllig et al. 2006).

The regions where molecular hydrogen undergoes a dissociation transition into neutral hydrogen are suitably named photodissociation regions (PDRs hereafter) and it is here that CO is also photodissociated. In this case, the CO flux per fixed hydrogen column is less than in high metallicity environments and, in turn, the Galactic conversion factor globally underestimates the true molecular hydrogen content (Arimoto, Sofue & Tsujimoto 1996; Leroy et al. 2011). This molecular gas, not traced by CO emission, has been referred to as the 'dark gas' (Grenier, Casandjian & Terrier 2005; Wolfire, Hollenbach & McKee 2010) and emits brightly in other finestructure PDR tracers such as [O I] and [C II]. In particular, [C II] is a promising tracer to quantify the total dark molecular gas reservoir. It was first used in a low metallicity dwarf galaxy by Madden et al. (1997) and is the focus of this work.

The [C II] 158  $\mu$ m emission line is one of the strongest coolants of the ISM and can contribute up to a few per cent of the total FIR emission from a galaxy (Tielens & Hollenbach 1985). Ionized carbon has a lower ionization potential than hydrogen (11.3 eV instead of 13.6 eV), and the [C II] line lies 92K above the ground state with a critical density for collisions with neutral hydrogen of  $3 \times 10^3$  cm<sup>-3</sup> (Kaufman et al. 1999). This means [C II] is produced not only in PDRs, but also in the ionized and atomic phases of the ISM. Measurements of the [C II] emission originating from the PDRs combined with measurements of CO (which can only arise in PDRs), can be used (a) to trace the total molecular reservoir on galaxy wide scales and (b) to quantify the nature of variations of the conversion function. We here use the nomenclature of a conversion 'function' because this quantity does vary as a function of ISM properties.

There have been a significant effort, both observationally and theoretically, made to establish a robust prescription for the conversion function (e.g. Wilson 1995; Israel 1997; Boselli, Lequeux & Gavazzi 2002; Israel & Baas 2003; Leroy et al. 2011; Genzel et al. 2012; Schruba et al. 2012; Bolatto, Wolfire & Leroy 2013; Sandstrom et al. 2013). However, a consensus has not yet been reached, and some empirical methods rely on the assumption of a universal gas depletion time-scale. To disentangle possible systematic variations in depletion time from the issues of CO in low metallicity environments, a possibility is to use multiwavelength observations to investigate the properties of the ISM (e.g. Magnelli et al. 2012).

By measuring carbon both in its molecular and ionized form in PDRs in a statistically robust sample of galaxies, with a full suite of multiwavelength observations, it is possible to investigate any secondary dependencies on the conversion function. Such a data set would allow us to fully parametrize and quantify variations in the conversion function with global galaxy properties. In this paper, we present CO (1–0) and [C II] observations of 24 intermediate mass (9 < log  $M_*/M_{\odot}$  < 10) and low metallicity (0.4 <  $Z/Z_{\odot}$  < 1.0) galaxies from the xCOLD GASS survey. We combine this with spectroscopic CO (1–0) and [C II] data from the Dwarf Galaxy Survey (DGS hereafter; Cormier et al. 2014; Madden et al. 2013; Rémy-Ruyer et al. 2014) to probe galaxies that are even more metal poor.

In Section 2, we present an overview of the survey and details regarding the data reduction of the IRAM CO (1–0), *Herschel* [C II] observations and auxiliary data from *WISE*, *GALEX* and SDSS. In Section 3, we provide scaling relations between integrated  $L_{[C II]}/L_{CO (1-0)}$  and global galaxy parameters. In Section 3.1, we explore the contribution of the [C II] emission from non-molecular regions and proceed to use a Bayesian Inference method and radiative transfer modelling to retrieve a prescription for the conversion function in Sections 4 and 5. Finally, we discuss the implications of our new prescription on molecular gas scaling relations in Section 6. Throughout this paper we use a standard flat  $\Lambda$ CDM cosmology with  $H_0 = 70 \text{ km s}^{-1} \text{ Mpc}^{-1}$ .

# 2 SURVEY DESCRIPTION AND SAMPLE SELECTION

The extension to COLD GASS is a randomly selected sample of galaxies from the regions of overlap between the SDSS (Stoughton et al. 2002), *GALEX* (Martin et al. 2005), *WISE* (Wright et al. 2010) and ALFALFA H I (Giovanelli et al. 2005) surveys. It is an unbiased sub-sample of all the galaxies in the redshift range 0.01 < z < 0.02 and is stellar mass selected ( $9 < \log M_*/M_{\odot} < 10$ ). There is no other selection criteria based on colour, star formation rate, etc. The SDSS data provide us with optical imaging and spectroscopy over the central 3 arcsec of our galaxies and with the *GALEX* and *WISE* data we have FUV, NUV, 3.4, 4.5, 12 and 22 µm photometry. The full xCOLD GASS sample contains 136 galaxies, which will be presented in full alongside all the CO (1–0) IRAM observations in Saintonge et al. 2017.

Our target selection for *Herschel* PACS observations involved removing from the total sample of 133 xCOLD GASS objects the passive elliptical galaxies, where Saintonge et al. (2011a) showed that molecular gas contributes insignificantly to the mass budget  $(M_{\rm H_2}/M_* < 0.2 \text{ per cent})$ , and one galaxy which already had adequate PACS observations. After this a mass-selected sample of 103 galaxies remain which allows for roughly 20 galaxies in 5 stellar mass bins between  $9 < \log M_*/M_{\odot} < 10$ . However, the *Herschel* telescope exhausted its supply of liquid helium coolant midway through our observations and so, out of those 103 galaxies for which the [C II] 158 µm line was observed with PACS.

We have H I fluxes for all the xCOLD GASS galaxies from observations at the Arecibo observatory as part of the GASS survey (Catinella et al. 2010, 2013), but they do not feature in the analysis presented in this paper. While the neutral phase of the ISM is important, the large size of the Arecibo beam ( $\sim$ 3.5 arcmin at these frequencies) prevents us from accurately determining H I fluxes from the regions of the galaxies covered by our CO and [C II] observations.

In order to provide a statistically robust prescription of the conversion function it is imperative to probe as large a parameter space as possible, hence we combine our data with literature data if possible. Unfortunately multiwavelength data sets with accurate galaxy parameter measurements and observations of both CO and [C II] are rare. Cormier et al. (2014) do present data for a compilation of galaxies from the DGS which have good CO(1–0) and [C II] observations, which we therefore add to the xCOLD GASS objects. We are interested in objects with total galaxy-wide integrated detections in CO(1–0) and [C II]; we therefore have to eliminate all objects which have optical diameters greater than 47 arcsec (the PACS IFU map size), and objects which have resolved interferometric CO observations as aperture corrections are impossible due to the unresolved nature of the *Herschel* PACS data.

Overall we are able to add seven extremely low metallicity galaxies,  $0.2 Z_{\odot} < Z < 0.5 Z_{\odot}$ , from the DGS survey; these are Haro 11, Mrk 930, Haro 3, Mrk 1089, UM 448, Haro 2 and II Zw 40. Derived galaxy parameters are found within Madden et al. (2013) while observed [C II]/CO(1–0) ratios, with aperture corrections, and star formation rates are calculated here. We fold these galaxies into our sample and derive all necessary measurements consistently as detailed below.

### 2.1 Optical, UV and IR data

For the xCOLD GASS galaxies parameters such as redshifts, sizes and magnitudes are retrieved from the SDSS DR7 data base (Abazajian et al. 2009). We retrieve stellar masses and emission line fluxes from the MPA-JHU catalogue<sup>1</sup> where calculations were performed using the methods presented in Tremonti et al. (2004) and Kauffmann et al. (2003). With these, we then calculate the gas-phase metallicity of the galaxies using the prescription from Pettini & Pagel (2004) (PP04 hereafter):

$$12 + \log(O/H) = 8.73 - 0.32 \log\left(\frac{[O \, \text{II}]}{H \,\beta} / \frac{[N \, \text{II}]}{H \,\alpha}\right),\tag{3}$$

which was calibrated down to the low metallicity range probed here. On this scale a value of  $12 + \log (O/H) = 8.69$  corresponds to solar metallicity following the oxygen abundance of Asplund et al. (2009). The stellar mass surface density is defined as

$$\mu_* = \frac{M_*}{2\pi R_{50,z}^2},\tag{4}$$

where  $R_{50,z}$  is the *z*-band 50 per cent flux intensity Petrosian radius, in kiloparsecs, taken from the SDSS data base.

For the DGS galaxies stellar masses and redshifts are taken from the catalogue presented in Madden et al. (2013), with an explanation on how these quantities were derived, while metallicities are taken from the literature and converted to PP04 units using the methods from Kewley & Ellison (2008).

To account for unobscured star formation we use *GALEX* FUV and NUV images retrieved from the public *GALEX* All-sky and Medium Imaging surveys (AIS and MIS, respectively; Martin et al. 2005), and for the obscured star formation we make use of *WISE* imaging. For both *GALEX* and *WISE* maps we perform aperture photometry using a similar data reduction technique to Wang et al. (2010). Total SFRs from the combination of UV and IR photometry are then calculated as presented in Saintonge et al. (2016) and we do this for both the xCOLD GASS and DGS samples.

From this it is possible to calculate, for both xCOLD GASS and DGS galaxies, the effective UV attenuation,  $A_{IRX}$ , where the log quantity is defined in Saintonge et al. (2013) as

$$A_{\rm IRX} = \left(\frac{\rm SFR_{\rm IR}}{\rm SFR_{\rm UV}} + 1\right)^{2.5}.$$
(5)

This is another important quantity which may correlate with  $L_{[C II]}/L_{CO(1-0)}$  – we express it in this form, as opposed to the log quantity, for mathematical convenience when performing the statistical analysis described later in Section 4. We also want to allow for the possibility of a redshift dependence in our conversion function and so we measure the distance off the main sequence for each galaxy. Using the analytical definition of the main sequence by Whitaker et al. (2012), where:

$$\log(\text{sSFR}_{\text{ms}}(z, M_*)) = -1.12 + 1.14z - 0.19z^2 - (0.3 + 0.13z) \\ \times (\log M_* - 10.5)[\text{Gyr}^{-1}], \tag{6}$$

with z and  $M_*$  denoting redshift and stellar mass, we can then define the distance off the main sequence as

$$\Delta(\text{MS}) = \frac{\text{sSFR}_{\text{measured}}}{\text{sSFR}_{\text{ms}}(z, M_*)},$$
(7)

which is applicable up to  $z \sim 2.5$ , as stated in Whitaker et al. (2012).

<sup>&</sup>lt;sup>1</sup> The data catalogues are available from http://www.mpa-garching.mpg. de/SDSS/.

#### 2.2 DSS observations and data reduction

To measure *r*-band magnitudes in a homogenous way between the xCOLD GASS and DGS samples we perform aperture photometry here; the DGS galaxies do not have SDSS photometric measurements unlike the former and so we utilize the ESO DSS (Digital Sky Survey). *R*-band images were downloaded from the ESO DSS Online Archive.<sup>2</sup> Photometry was then carried out using the same apertures as for the *GALEX* and *WISE* images, allowing for the calculation of consistent, aperture-matched NUV-*r* colours.

#### 2.3 Herschel observations and data reduction

Twenty-four of the galaxies within the xCOLD GASS survey were observed with the PACS spectrometer (Poglitsch et al. 2010) onboard *Herschel* (Pilbratt et al. 2010) as part of the programme OT2\_asainton\_1, P.I.: A. Saintonge. The seven DGS galaxies were observed as part of a guaranteed time key programme.

The PACS array is composed of  $5 \times 5$  square spatial pixels each of side 9.4 arcsec, covering a total field of view of 47 arcsec. The observations were carried out in line-spectroscopy mode. The data were reduced using the Herschel Interactive Processing Environment (Ott 2010). We used standard scripts of the PACS spectrometer pipeline to reduce the data from the raw product to its level 2 processed form. From this, line fitting was done using IDL scripts, written by the first author, employing routines within the IDL Astronomy User's Library (http://idlastro.gsfc.nasa.gov/). The lines are well fitted with a single Gaussian using the IDL fitting routine GAUSSFIT. The signal from each spaxel of the PACS array is fitted with a second-order polynomial with the addition of a Gaussian for the baseline and emission line, respectively. From this we calculate the S/N in each spaxel. To calculate the total flux for each individual galaxy, we add up the integrals of the fitted Gaussians from all the spaxels which have a S/N > 3. For total uncertainties we assume a 30 per cent error of the total [C II] line flux, due to calibration errors (Poglitsch et al. 2010). With Herschel all 24 xCOLD GASS galaxies show a clear detection in [C II] with a S/N > 3, while all seven DGS galaxies also show clear detections.

We want to directly compare the [C II] line luminosities with the CO (1-0) luminosity and to do this we convolve the PACS spaxel array with the IRAM CO (1-0) beam, detailed in Section 2.4. We approximate the IRAM beam point spread function (PSF) as a Gaussian, with a full width at half-maximum (FWHM) of 21.4 arcsec, where the peak is normalized to one.<sup>3</sup> The procedure takes into account the *Herschel* PSF in the individual spaxels. We do this for all the xCOLD GASS objects. For the DGS objects we do different aperture corrections depending on the size of the beam PSF used for each individual CO (1-0) measurement Rémy-Ruyer et al. (2014).

#### 2.4 IRAM observations and data reduction

Observations were carried out at the IRAM 30m telescope, as part of the xCOLD GASS survey, using the Eight Mixer Receiver (EMIR; Carter et al. 2012) to observe the CO(1-0) line, which has a rest frequency of 115.27 GHz. EMIR allows for observations on two sidebands with 8 GHz bandwidth per sideband per polarization.

The second band was tuned to cover the redshifted CO (2-1).<sup>4</sup> The observing strategy was identical to that described in Saintonge et al. (2011b) for the initial COLD GASS survey.

The xCOLD GASS data are reduced using the Continuum and Line Analysis Single-dish Software (CLASS<sup>5</sup>) which is part of the GILDAS software. All scans are visually inspected and those with anomalous features, such as distorted baselines or increased noise due to poor atmospheric conditions or high water vapour levels, are discarded. The individual scans for a single galaxy are baselinesubtracted, using a first-order fit, and then combined. This average spectrum is then binned to achieve a resolution of ~20 km s<sup>-1</sup> and the rms is obtained and recorded. The flux of the CO(1–0) line is measured by adding the signal within an appropriately defined frequency window; in the case of a detection this window is set by hand to match the observed line profile. For the null detection scenario the window is set to a width of 200 km s<sup>-1</sup> or to the full width of the H 1 line. Uncertainties on the CO(1–0) line flux is calculated as

$$\epsilon_{\rm obs} = \frac{\sigma_{\rm rms} W 50_{\rm CO}}{\sqrt{W 50_{\rm CO} \Delta w_{\rm ch}^{-1}}},\tag{8}$$

where  $\Delta w_{\rm ch}$ , the width of each spectral channel, is equal to  $\sim 21$  km s<sup>-1</sup> with mild variations due to differing redshifts. The rms noise per spectral channel is denoted by  $\sigma_{\rm rms}$  and W50<sub>CO</sub> is the FWHM of the CO (1–0) line.

As mentioned in Section 2.3, we convolved the PACS spaxel array with the IRAM CO (1–0) beam to measure the  $L_{[C II]}/L_{CO (1-0)}$  ratio over the footprint of the IRAM beam (or for the different beam FWHMs for the CO (1–0) observations in the DGS sample). As the angular size of the xCOLD GASS galaxies is larger than the IRAM beam, small aperture corrections need to be applied to obtain total CO fluxes. We calculated these aperture corrections as in Saintonge et al. (2012), and apply them to obtain total molecular gas masses when investigating the molecular gas scaling relations (in Section 6).

We plot the IRAM and *Herschel* spectroscopic data for an example galaxy in Fig. 1, with similar figures for all 24 galaxies available online. For the DGS galaxies, we use the CO (1–0) fluxes compiled by Rémy-Ruyer et al. (2014). The measured [C II] and CO (1–0) line luminosities, as well as key physical parameters are given for the xCOLD GASS objects in Table 1, and for the DGS galaxies in Table 2. The CO (1–0) line luminosities are given in units of solar luminosity for comparison with the [C II] luminosities. They are related to  $L'_{CO(1-0)}$  in units of K km s<sup>-1</sup> pc<sup>2</sup> as  $L'_{CO(1-0)} = 2.04 \times 10^4 L_{CO(1-0)}$  (Solomon et al. 1997).

# **3 OBSERVATIONAL RESULTS:** [C 11]/CO SCALING RELATIONS

In Fig. 2, we present the  $L_{\rm [C\,II]}/L_{\rm CO(1-0)}$  scaling relations for the 23 galaxies from the xCOLD GASS sample and the seven galaxies from the DGS, against a range of parameters describing the global physical properties of the galaxies. Although there is evident scatter, a clear dependence of  $L_{\rm [C\,II]}/L_{\rm CO(1-0)}$  on many of the parameters is observed. We use the Pearson correlation coefficient, *r*, to quantify the strength of the dependence; a more refined statistical approach is presented later in Section 4.

<sup>&</sup>lt;sup>2</sup> http://archive.eso.org/dss/dss

<sup>&</sup>lt;sup>3</sup> The IRAM beamwidth and beam efficiencies used in these calculation can be found at http://www.iram.es/IRAMES/mainWiki/Iram30mEfficiencies.

<sup>&</sup>lt;sup>4</sup> The analysis of this paper will focus on the CO(1-0) data only. The

CO(2-1) data will be presented in a future publication.

<sup>&</sup>lt;sup>5</sup> http://www.iram.fr/IRAMFR/GILDAS/doc/html/class.html



**Figure 1.** Example of the IRAM and *Herschel* data products for an example galaxy, G108045. *Left:* spectra centred on the [C II] 158  $\mu$ m emission line for each of the 16 PACS spaxels, with the best Gaussian fit to the lines detected with S/N>3 also shown. *Top right:* SDSS image showing the position of the PACS spaxels (blue squares) and of the IRAM beam which was used to measure the CO(1–0) and CO(2–1) lines, in red and yellow, respectively. *Bottom right:* CO(1–0) and CO(2–1) spectra from the IRAM 30m. Similar figures for all 24 xCOLD GASS galaxies are available as supplementary material online.

The  $L_{[CII]}/L_{CO(1-0)}$  depends most strongly on parameters which (a) describe the strength of the UV radiation field and (b) describe the ability of the CO molecule to shield itself, via dust, from the UV radiation impinging on the surface of the molecular regions deep inside the PDR. A clear dependence of  $L_{[CII]}/L_{CO(1-0)}$  on the colour of the systems, parametrized by NUV-r photometry, is observed, as well as the specific star formation rate, distance from the main sequence, UV field hardness and the gas-phase metallicity. The two former quantities are directly linked because NUV-r is a good proxy for sSFR since it relates a quantity tracing ongoing star formation activity (NUV magnitudes) and a quantity sensitive to the older stellar population (r-band magnitudes). Their differences arise as the sSFR takes into account internal dust attenuation while NUV-r is not dust corrected. Furthermore, the gas-phase metallicity can be seen as a proxy for the total dust to gas mass fraction (via a metallicity-dependent dust-to-gas ratio). It is this dust which shields the CO molecule from the UV radiation, with decreasing metal content the systems become more dust poor allowing the UV radiation to penetrate deeper into the molecular clouds.

Overall the strongest dependencies in Fig. 2 are on quantities that are sensitive to the amount of UV radiation penetrating into the molecular clouds, photodissociating CO into its ionized form. Of the four parameters mentioned above the dependence on metallicity is strongest and will be further justified with the full multiparameter Bayesian treatment in Section 4. Conversely the  $L_{[C II]}/L_{CO(1-0)}$  ratio does not depend strongly on parameters which describe the masses and structural properties of the galaxies. A low correlation is observed with the stellar mass of the systems, and with the morphology as measured by the stellar mass surface density,  $\mu_*$ . This implies that CO photodissociation is happening on the small scales of molecular clouds as the largescale global properties of galaxies have a low correlation; global properties are likely less important than local ones.

Finally, rather interestingly, the  $L_{\rm [C II]}/L_{\rm CO(1-0)}$  ratio does not depend strongly on the extinction, calculated from equation (5) which is a measure of dust emission versus emission from young stars. Importantly, it is a tracer of gas density and metallicity; the clear dependance on metallicity, explained above, suggests that the gas density may not correlate strongly with  $L_{[CII]}/L_{CO(1-0)}$ . We speculate that the reason for this is that on small scales these low-mass, low metallicity galaxies are flocculent with very clumpy structures, hence an averaged density across the galaxy washes out average variations of the  $L_{[CII]}/L_{CO(1-0)}$  ratio on small scales. An alternative explanation for the low correlation with extinction is because, in particular at low stellar mass, NUV and 22 µm emission do not originate from the same H II regions (Galametz et al. 2010), and so we are not tracing the extinction of the same star-forming clouds. It is difficult to disentangle these two effects, assuming both play a role, or to rule either one out.

Our results qualitatively imply that metallicity, colour, sSFR,  $\Delta$ (MS) and/or hardness of the UV radiation field are responsible

xCOLD GASS ID	$\log M_*$ (M <sub>O</sub> )	ZSDSS	$\frac{\text{SFR}}{(\text{M}_{\bigodot} \text{ yr}^{-1})}$	12+log(O/H)	$\log L_{[CII]} (L_{\bigodot})$	$\log L_{\rm CO(1-0)} \ (\rm L_{\bigodot})$	log sSFR (yr <sup>-1</sup> )	$f_{[C II],mol}$ (per cent)
107026	9.37	0.0167	0.34	8.55	6.65	2.92	-9.84	67.21
108064	9.56	0.015	0.75	8.64	7.05	3.45	-9.68	64.4
108080	9.31	0.0153	0.05	8.7	5.81	2.99	-10.61	76.8
108093	9.94	0.0168	0.68	8.78	7.48	3.98	-10.11	71.3
108113	9.88	0.0199	5.12	8.79	6.99	3.75	-9.17	53.62
108129	9.47	0.0175	0.19	8.45	6.39	3.11	-10.19	72.37
108142	9.61	0.019	0.71	8.7	7.27	3.36	-9.76	65.84
108147	9.64	0.0197	0.62	8.67	7.14	3.43	-9.85	67.37
101037	9.31	0.0164	0.27	8.61	6.93	3.22	-9.88	67.86
108050	9.75	0.0162	0.76	8.82	7.32	3.76	-9.87	67.7
108021	9.64	0.0173	0.37	8.82	7.2	3.86	-10.07	70.75
109066	9.99	0.0149	0.14	8.71	6.79	3.38	-10.84	78.42
109101	9.01	0.0104	0.15	8.52	6.31	2.31	-9.83	67.04
109038	9.21	0.0116	0.66	8.4	7.24	3.11	-9.39	58.62
109139	9.59	0.0188	0.93	8.78	7.25	3.6	-9.62	63.28
109092	9.7	0.018	0.58	8.68	7.12	3.58	-9.94	68.82
109072	9.68	0.0189	0.73	8.79	7.22	3.6	-9.82	66.87
109010	9.75	0.0102	0.69	8.66	6.87	3.54	-9.91	68.34
109102	9.38	0.0117	0.44	8.33	6.82	2.93	-9.74	65.49
110038	10.0	0.0166	0.51	8.71	7.03	3.72	-10.29	73.6
109109	9.08	0.0196	0.27	8.61	6.63	_	-9.65	63.85
108054	9.93	0.0125	0.65	8.66	6.85	3.65	-10.12	71.44
108045	10.08	0.015	1.76	8.69	7.62	4.22	-9.83	67.04
109028	10.07	0.0178	1.36	8.73	7.56	4.17	-9.94	68.82

Table 1. Derived observational quantities for the xCOLD-GASS galaxies.

Table 2. Derived observational quantities for the seven DGS galaxies.

DGS name	$\log M_*$ (M <sub>☉</sub> )	Z	$\frac{\text{SFR}}{(\text{M}_{\bigodot} \text{ yr}^{-1})}$	12+log(O/H)	$\frac{\log L_{\rm [C II]}}{(\rm L_{\bigodot})}$	$\frac{\log L_{\rm CO(1-0)}}{(\rm L_{\bigodot})}$	log sSFR (yr <sup>-1</sup> )	$f_{[C II],mol}$ (per cent)
Haro 11	10.24	0.0206	37.53	8.32	8.08	3.7	-8.67	40.3
Mrk 930	9.44	0.0183	2.78	8.08	7.44	2.81	-9.0	49.39
Haro 3	9.49	0.0031	0.55	8.12	6.49	2.42	-9.75	65.66
Mrk 1089	10.28	0.0134	5.72	8.3	7.59	3.8	-9.52	61.32
UM 448	10.62	0.0186	9.53	8.1	8.14	3.93	-9.64	63.66
Haro 2	9.56	0.0048	1.24	8.39	6.89	3.29	-9.47	60.3
II Zw 40	8.6	0.0026	0.57	7.92	6.41	1.92	-8.84	45.13

for variations in the  $L_{[C II]}/L_{CO(1-0)}$  ratio as the latter three parameters are responsible for the total amount of UV radiation impinging on to the surface layer of molecular clouds. As these three parameters are correlated we may not need all three to statistically parametrize a prescription for  $L_{[C II]}/L_{CO(1-0)}$  and hence the conversion function; a rigorous statistical approach, employing Bayesian methods, is shown below in Section 4.

#### 3.1 Contamination of the [C II] emission by non-PDR sources

The scaling relations in Fig. 2 show integrated measurements across all phases of the ISM, however to accurately measure variations of the conversion function we must restrict our analysis to variations in the  $L_{\rm [C\,II]}/L_{\rm CO\,(1-0)}$  ratio from molecular regions only. The CO (1–0) emission line only originates from molecular regions while [C II] emission originates from all phases of the ISM; therefore we must clean for the contaminant [C II] emission arising from non-molecular regions.

Galaxy wide observations of the [C II] fraction emerging from molecular regions are uncommon and unfortunately an empirical prescription for this quantity does not exist, even though it is becoming apparent that the fraction of [C II] emission across galaxies can vary. Pineda et al. (2013) have studied this quantity across the Milky Way, as part of the GOT C<sup>+</sup> survey, and found the fraction to be 75 per cent. Further observations have been done which accurately measure the fraction of [C II] emerging from ionized gas regions, using the method of Oberst et al. (2006). This utilizes the [C II]/[N II] 205  $\mu$ m and [N II]122  $\mu$ m/[N II] 205  $\mu$ m ratios. A study of NGC 891 by Hughes et al. (2015) used this method and found that between 15 per cent and 65 per cent of [C II] emission can arise from ionized regions. A further study of the star-forming region BCLMP 302 in M33 by Mookerjea et al. (2011) found that 20–30 per cent of [C II] emission arose from ionized regions while Kramer et al. (2013) find that the contribution from the HI gas rises to about 40 per cent in the outskirts of M33. Therefore, to study variations in the conversion function, it is crucial to remove non-molecular [C II] emission from our analysis.

Recent work by Accurso et al. (2017) provides a prescription to predict the fraction of [C II] emission originating from molecular regions as a function of galaxy properties. A new multiphase 3D radiative transfer interface was used through the coupling of STARBURST99 (Leitherer et al. 1999, 2010), a Stellar Spectrophotometric code, with MOCASSIN (Ercolano et al. 2003; Ercolano, Barlow & Storey 2005), a photoionization code and 3D-PDR (Bisbas



Figure 2. Scaling relations between the  $L_{[Cu]}/L_{CO(1-0)}$  ratio and global properties for the 23 xCOLD GASS objects (blue symbols) and the seven galaxies from the DGS (red symbols). The Pearson correlation coefficient and the best-fitting linear relation are shown in each panel.

et al. 2012), an astrochemistry code. A detailed explanation of the work can be found in Accurso et al. (2017), but a summary follows.

Individual spherically symmetric star-forming regions, with a central population of stars surrounded by gas, were simulated as follows. First, the stellar radiation density field, coming from the stellar population centrally located with the star-forming regions, is created using sB99. From this output stellar spectrum, the luminosity, temperature and number of ionizing photons of the source are calculated; these quantities are then used as input parameters for the 3D photoionization code MOCASSIN, which is used to simulate the ionized gas surrounding the stellar population. The important output of the MOCASSIN code is the SED of the ionized gas, dust and stars emerging from the ionized region. This can be used to calculate the strength of the radiation field,  $G_0$ , which impinges on to the PDR surface, by integrating the MOCASSIN SED in the far-UV range between 912 and 2400 Å. This value of  $G_0$  is used as an input into 3D-PDR which simulates the ionized and molecular gas. Constant hydrogen number density profiles were assumed in each ISM region and the dust-to-gas ratio scaled with the input metallicity.

To jump from these simulated star-forming regions to the ISM of entire galaxies it was assumed that the physical conditions found in each cloud, for a given set of input parameters, can represent the average physical conditions found on galaxy-wide scales for galaxies with similar physical properties. Under this assumption a whole galaxy can be considered to be built up from a number of identical star-forming regions, hence it provides a larger whole-galaxy model of the ISM. A summary of the input parameters was given in Table 2 of the aforementioned paper and they do consider the metallicity and sSFR regimes probed here.

Through a Bayesian Inference method, several analytical functions were provided which can be used for this work. Specifically, as we do not have H  $\pi$  region electron densities for the xCOLD GASS and DGS samples, we will use the prescription involving sSFR only, namely

$$f_{\rm [C\,I],\,mol} = -6.224 - 1.235\psi - 0.0543\psi^2,\tag{9}$$

where  $f_{[C II],mol}$  is the fraction of [C II] emission originating from molecular regions where at least 1 per cent of gas is in the form



Figure 3. Same scaling relations as presented in Fig. 2, but with the [C II] luminosities corrected for emission not originating from molecular regions.

of H<sub>2</sub>, and  $\psi = \log(\text{sSFR})$ . The error on this quantity is  $\sigma_{f_{[C\,I],mol}} = 0.063$ , the rms uncertainty from the fitting. The physical motivation for equation 9 can be found in Accurso et al. (2017). We apply this to the 23 xCOLD GASS and seven DGS galaxies used in this work to estimate the relative fraction of [C II] emission arising from molecular regions only. These values are in the range of 79– 48 per cent as shown in Tables 1 and 2. In these tables, we also provide the integrated CO (1–0) and uncorrected [C II] luminosities for readers who are trying to model galaxies and want to match the uncorrected results.

The simulations of Accurso et al. (2017) do not consider the diffuse neutral medium owing to its extremely low density, however they do have an atomic gas component which represents the CNM. The [C II] emission originating from this atomic component will not be included in the  $f_{[C II],mol}$  term, calculated from the simulations, and therefore Accurso et al. (2017) does consider a CNM-like component when transitioning from ionized to molecular states; however this is not of interest to this paper as we only need the fraction of [C II] emission originating from molecular regions.

### 3.2 Corrected [C II]/CO scaling relations

In Fig. 3, we present the  $L_{[CII]}/L_{CO(1-0)}$  scaling relations for molecular regions by using the estimated fractions of ionized carbon emission arising from this phase of the ISM. As can be seen the correction for contaminant ionized carbon emission does not affect the qualitative trends shown in Section 3. There are mild changes in the statistical trends seen as, in most cases, the measure of correlation decreases as expected as the  $L_{[CII]}/L_{CO(1-0)}$  numerical values have now decreased. Our corrected scaling relation still imply that metallicity, colour, sSFR,  $\Delta$ (MS) and/or hardness of the UV radiation field are responsible for variations in the conversion function. The Pearson correlation coefficients and best-fitting linear relations in Fig. 3 are only intended to help with the interpretation and as an indication at this point of the analysis; only the data themselves enter in the Bayesian analysis described below. While some of the trends appear to be driven in part by the DGS galaxies, we show later in Section 4.2 that the final result of this study, the derivation of the  $\alpha_{CO}$  function, is consistently reproduced using the xCOLD GASS objects only.

# **4 BAYESIAN INFERENCE**

Following on from the observational scaling relations, shown in Fig. 3, we now want (a) to parametrize an analytic expression for the [C II]/CO luminosity ratio from molecular regions as a function of galaxy parameters and (b) to determine the minimum number of parameters needed to provide a statistically robust fit to our data. With eight galaxy parameters<sup>6</sup> available we fit models with different number of free variables using all the possible combinations of parameters, e.g. we have  ${}^{8}C_{k}$  number of models when we are fitting for k number of parameters. We perform a Bayesian interference method to find the best-fitting relations and to find the minimum number of variables needed to fit the data. Bayesian interference fitting methods have been successfully employed in several, wideranging, astrophysical scenarios from the derivation of the extinction law in the Perseus molecular cloud (Foster et al. 2013) and Type Ia supernova light-curve analysis (Mandel, Narayan & Kirshner 2011) to the extragalactic Kennicutt-Schmidt relation (Shetty, Kelly & Bigiel 2013) and the formation and evolution of Interstellar Ice (Makrymallis & Viti 2014). For a more in depth explanation of the Bayesian regression fitting method we refer the reader to Kelly (2007) and restrict ourselves here to the basic concepts.

The first step is to assume that the measurement uncertainty associated with each [C II]/CO observation, for each galaxy, ( $y_i$  hereafter) is normally distributed. Therefore  $y_i$  is a random variable distributed like

$$y_i = \mathcal{N}\left(y_{\text{true},i}, \sigma_{y_i}^2\right),\tag{10}$$

where  $\sigma_{y_i}$  is the measurement uncertainty associated with the observable *y* on the ith galaxy. As can be seen in Fig. 3, all the observed scaling relations show evidence of either no correlation or a linear correlation between the log variables. We therefore use power-law models in linear space as none of the above plots, in log space, show higher polynomial behaviour such that

$$y_i = 10^{\alpha} \left( x_i^j \right)^{\beta_j},\tag{11}$$

where  $\alpha$  and  $\beta_j$  are free variables to be found. We can say that the probability of observing our data, given the true value of the observables and the measurement uncertainties is

$$P(y_i|y_{\text{true},i},\sigma_{y_i}) = \frac{1}{\sqrt{2\pi\sigma_{y_i}^2}} \exp\left(-\frac{\left(y_i - 10^{\alpha} \left(x_i^j\right)^{\beta_j}\right)^2}{2\sigma_{y_i}^2}\right).$$
(12)

The next assumption to make is that all our [C II]/CO observables are independent, e.g. each  $y_i$  and  $x_i^j$  are independent, which is perfectly reasonable as the result from one galaxy will not affect the result from another. With this, and using the definition of independent probabilities, we can simply multiply all the individual probabilities together. Therefore this product of probabilities is our likelihood, denoted *L*. By taking the log-likelihood,  $\mathcal{L}$ , the product returns back to a sum so

$$\mathcal{L} = -\frac{N}{2}\ln(2\pi) - \frac{1}{2}\sum_{i=1}^{N}\ln\left(\sigma_{y_{i}}^{2}\right) - \frac{1}{2}\sum_{i=1}^{N}\frac{\left(y_{i} - 10^{\alpha}\left(x_{i}^{j}\right)^{\beta_{j}}\right)^{2}}{\sigma_{y_{i}}^{2}},$$
(13)

<sup>6</sup> We do not include sSFR in our fitting procedure as this is very similar to  $\Delta$ (MS) which itself can be used to include a redshift dependence applicable up to  $z \sim 2.5$ , the highest redshift probed in the  $\Delta$ (MS) prescription of Whitaker et al. (2012).

MNRAS 470, 4750-4766 (2017)

where *N* is the sample size. Maximizing this log-likelihood for all of our models, at fixed number of free parameters, will provide us with the best-fitting models for a given number of free parameters.

#### 4.1 Model comparison and sampling methods

We aim to maximize the likelihood for our fits where the number of degrees of freedom varies. To compare likelihoods from models with different numbers of free parameters we use two different methodologies. First, we employ the Akaike Information Criterion (AIC; Akaike 1981):

AIC = 
$$-2\mathcal{L} + 2p + \frac{2p(p+1)}{N-p-1}$$
, (14)

where p is the number of free parameters and N is the sample size and the preferred model is that which minimizes AIC. We also use a second method by employing the Bayesian Information Criterion (BIC; Schwarz 1978):

$$BIC = -2\mathcal{L} + pLog(N), \tag{15}$$

where *p* and *N* are defined as above. We compare the results of both these two methodologies to check for agreement and to ensure our results are not biased depending on what information criterion is employed.

A direct derivation/solution for the parameters which maximize the likelihood function, equation (13), is computationally expensive and so, to efficiently and effectively sample the full parameter space, we use the well tested PYTHON implementation of the affine-invariant ensemble sampler for Markov Chan Monte Carlo EMCEE<sup>7</sup> (Goodman & Weare 2010).

#### 4.2 Statistical results

In total we run  $\sum_{i=1}^{8} {}^{8}C_i$  models with the results presented below. By maximizing the likelihood for each number of free parameters (from one to eight), and then comparing models with different sample sizes, and using the BIC and AIC, we find that only two parameters are necessary to fully explain the trends seen in Fig. 3. We show in Fig 4 variations of the BIC and AIC with different number of free parameters. Both the AIC and BIC method agree that only two free parameters are necessary to provide a statistically robust fit to the data and so our choice of information criterion is extraneous.

For the two-parameter case both the AIC and BIC retrieve metallicity and  $\Delta(MS)$  as the two galaxy parameters needed to provide a good fit to the data (the two-parameter model which has the highest likelihood value in both cases). The best-fitting analytical prescription is

$$\log\left(\frac{L_{\rm [C\,II]}}{L_{\rm CO}}\right) (\pm 0.223 \text{ dex}) = 11.204 + 0.230 \log \Delta(\rm MS) - 0.905[12 + \log(\rm O/\rm H)],$$
(16)

which has a regression correlation coefficient of 0.801 meaning that these two parameters alone account for 80.1 per cent of the correlation, with an error on the predicted [C II]/CO luminosity ratio of 0.223 dex. As the number of free parameters increases (from one to eight), the log posterior and log-likelihoods also decrease; hence doing a likelihood ratio analysis would have been insufficient to recover our best-fitting two-parameter relation as this would have returned the eight-parameter case as the best relation as these have the smallest posteriors. We stress that our aim was to find a relation

<sup>&</sup>lt;sup>7</sup> An example of the code can be found at http://dan.iel.fm/emcee/current/.



**Figure 4.** Akaike Information Criterion (turquoise) and the Bayesian Information Criteria (orange) for the best-fitting models when varying the number of galaxy parameters. Both tests indicate that two galaxy parameters are optimal to describe the variations in  $L_{[C II]}/L_{CO (1-0)}$ .

which can explain the correlation with as few observables as possible. Only by employing the AIC and BIC, as above, we were able to find our best-fitting relation with only two parameters.

We also fit solely to the xCOLD GASS objects to demonstrate that our result is secure even when including the DGS galaxies. For the xCOLD GASS objects we find

$$\log\left(\frac{L_{\rm [C\,II]}}{L_{\rm CO}}\right) = 12.21 + 0.266 \log \Delta(\rm MS) - 1.0189[12 + \log(\rm O/\rm H)],$$
(17)

which differs from 16 by no more than 25 per cent, well within the observational scatter.

# 5 RADIATIVE TRANSFER MODELLING – CONNECTING [C 11]/CO AND $\alpha_{CO}$

The objective in obtaining the above scaling relations is to be able to derive a parametrization for the conversion function. There are two main parameters responsible for variations in the  $L_{[CII]}/L_{CO(1-0)}$ fraction, namely metallicity and  $\Delta(MS)$ , and so it is necessary to understand how to go from a  $L_{[CII]}/L_{CO(1-0)}$  parametrization to one for  $\alpha_{CO}$ .

To better understand the astrochemical reactions involved in the photodissociation of CO we inspect the chemical reaction data base employed in the PDR code 3D-PDR (Bisbas et al. 2012). The main reactions involved in photodissociation of CO arise from the interaction of molecular species with cosmic rays and UV photons. The dominant reactions<sup>8</sup> involving UV photons and CO are

$$CO + \gamma \rightarrow O + C,$$
 (18)

$$C + \gamma \to C^+ + e^- \tag{19}$$

indicating that, whenever CO interacts with UV photons, neutral carbon is formed first as an intermediate species, but then quickly gets ionized as the reaction rates are of the same order;<sup>9</sup> hence only ionized carbon forms when CO reacts with UV photons. Moreover, the reaction of CO with cosmic rays (denoted CRP) happens either via the formation of a free radical, namely He<sup>+</sup>, as follows,

$$\text{He} + \text{CRP} \rightarrow \text{He}^+ + \text{e}^-,$$
 (20)

$$\mathrm{He}^{+} + \mathrm{CO} \to \mathrm{O} + \mathrm{C}^{+} + \mathrm{He}, \qquad (21)$$

$$\mathrm{He^{+}} + \mathrm{CO} \to \mathrm{O^{+}} + \mathrm{C} + \mathrm{He}, \tag{22}$$

or directly as,

$$CO + CRP \rightarrow O + C.$$
 (23)

These show how, via cosmic rays, the photodissociation of CO can lead to the formation of neutral and ionized carbon species. Recent work by Bisbas, Papadopoulos & Viti (2015) has shown that ionized carbon is the main product formed through the photodissociation of CO, but knowledge of how much neutral carbon forms is crucial to accurately constrain a prescription of  $\alpha_{\rm CO}$  as we only have observed CO and [C II], lacking C I observations.

To describe the formation of neutral carbon we rely on the multiphase ISM numerical simulations performed in Accurso et al. (2017). We take their simulated low-redshift cloud results and here plot in Fig. 5 the variations of the molecular region  $L_{[C II]}/L_{CO(1-0)}$ against  $\alpha_{CO}$  for the 2160 simulated clouds with colours indicating varying metallicities and  $\Delta$ (MS) of the clouds. Accurso et al. (2017) do not discuss  $\alpha_{CO}$ , hence we calculate this here. For each simulated cloud we calculate the total molecular hydrogen mass and total CO(1-0) luminosity and hence can accurately obtain an  $\alpha_{CO}$ value. We find that these two parameters, along with  $L_{[C II]}/L_{CO(1-0)}$ , account for 98.4 per cent of the total correlation with  $\alpha_{CO}$ . We therefore perform a three-dimensional linear fit to the above data, using the PYTHON SciPy routine CURVE-FIT, and find

$$\log \alpha_{\rm CO} = 0.742 \log \frac{L_{\rm [C\,II]}}{L_{\rm CO(1-0)}} - 0.944 [12 + \log({\rm O/H})] - 0.109 \log \Delta({\rm MS}) + 6.439.$$
(24)

The errors on the estimated parameters are less than 0.01 dex and hence are negligible, owing to the high level of correlation retrieved from the fitting, and therefore can be ignored. We emphasize that this fit was done to the simulated data, hence the high degree of certainty in the  $\alpha_{\rm CO}$  calculation. This has been normalized to the known Milky Way values for  $\alpha_{\rm CO}^{\rm solar} = 4.36 \, {\rm M}_{\odot}$  (K km s<sup>-1</sup>)<sup>-1</sup> (helium corrected) and  $(L_{\rm [C II]}/L_{\rm CO (1-0)})^{\rm solar} = 1400$  from Stacey et al. (1991). We then combine this with equation (16) to finally arrive at a prescription for the CO conversion function:

$$\log \alpha_{\rm CO}(\pm 0.165 \text{ dex}) = 14.752 - 1.623[12 + \log(O/H)] + 0.062 \log \Delta(MS),$$
(25)

where  $12 + \log(O/H)$  is the metallicity in PP04 units, with an error on the predicted  $\log \alpha_{CO}$  estimate of  $\pm 0.165$ . Metallicity predominantly drives variations in  $\log \alpha_{CO}$  with  $\Delta(MS)$  playing a secondary, though statistically important, role.

<sup>&</sup>lt;sup>8</sup> By this we mean the reactions with the highest reaction rates which provide the main routes for creation and destruction of molecular species.

 $<sup>^9</sup>$  The reaction rates for these two are 2.0  $\times$   $10^{-10}$  and 3.0  $\times$   $10^{-10}$  s^{-1}, respectively.



Figure 5. Variations of the molecular region  $L_{[C II]}/L_{CO(1-0)}$  against  $\alpha_{CO}$  for the 8640 simulated clouds in Accurso et al. (2017). Clouds are colour-coded by metallicity (left) and  $\Delta(MS)$  (right).

The result of this study is therefore a new CO-to-H<sub>2</sub> conversion function which involves metallicity and  $\Delta$ (MS), and which is applicable on galaxy-wide scales for star-forming galaxies up to  $z \sim 2.5$ (the highest redshift constrained by equation 7). The dependence on metallicity is consistent with other conversion functions as will be shown further in Section 5.3. The secondary dependence of  $\alpha_{CO}$ on  $\Delta$ (MS), or more generally speaking on a parameter relating to the strength of the UV radiation field, does not come as a surprise as it has been previously observed or predicted by simulations and theoretical models (e.g. Israel 1997; Wolfire et al. 2010; Sandstrom et al. 2012; Clark & Glover 2015). The interesting result here is that the dependence of  $\alpha_{CO}$  and both metallicity and  $\Delta$ (MS) was not forced, it came out naturally from the data through the Bayesian analysis technique.

#### 5.1 Caveat - suitability across the main sequence

There are two different well-studied regimes where  $\alpha_{CO}$  is known to show deviations from the Galactic value. The first is the situation of low metallicities discussed above, when CO suffers from photodissociation from the UV radiation field. The second regime is the one where the gas is affected by dynamical effects (mostly galaxy mergers), making the ISM mostly molecular and changing gas temperatures and line widths. This has been well studied in the case of local ULIRGS, with Solomon et al. (1997) reporting that an  $\alpha_{CO}$  value of 1.0 M<sub> $\odot$ </sub> (K km s<sup>-1</sup>)<sup>-1</sup> is more appropriate than the Galactic value. There will be galaxies which 'suffer' from both effects, and therefore the two should ideally be studied simultaneously. While this has been done in a small number of studies (see Bolatto et al. 2013, and references therein), it is unfortunately not possibly here as we do not have a sample of galaxies which simultaneously have low metallicities and dense ISMs, and the appropriate CO and [C II] data products.

Therefore, the conversion factor given as equation (25) should only be applied to galaxies within the parameter space constrained here, i.e. for those with 7.9 < 12 + log (O/H) < 8.8 and  $-0.8 < \log \Delta(MS) < 1.3$ . For galaxies with 12 + log (O/H) > 8.8 we recommend using the value obtained when using 12 + log (O/H) = 8.8, and for galaxies with log  $\Delta(MS) < -0.8$  we recommend using the value obtained by setting log  $\Delta(MS) = -0.8$ . Because of a lack of data for galaxies below the main sequence, this is the most conservative thing to do, as opposed to allowing the trends to continue into regimes where it was not constrained. The conversion function will level out to a constant value, roughly equal to the galactic conversion factor value, consistently with other studies of early-type passive galaxies (Davis et al. 2014).

Similarly, equation (25) should not be applied to galaxies well above the main sequence, where dynamical effects may be compressing the ISM, leading to higher gas densities and dust temperatures. For galaxies which show evidence of being in this regime (e.g. Saintonge et al. (2012) use the selection criteria of  $L_{\text{FIR}}/L_{\odot} > 11.0$ and  $S_{60 \,\mu\text{m}}/S_{100 \,\mu\text{m}} > 0.5$ ), we recommend the use of a lower value of  $\alpha_{\rm CO} = 1 \, {\rm M}_{\odot} \, ({\rm K \, km \, s^{-1}})^{-1}$ . A major consequence of this is a discontinuity of  $\alpha_{\rm CO}$ ; when moving up through the main sequence  $\alpha_{\rm CO}$ increases and suddenly decreases as  $\log \Delta(MS) > 1.3$ . This has also been recently suggested by Sargent et al. (2014) who find that  $\alpha_{CO}$ increases with increasing sSFR and then suddenly decreases when entering the starburst regime. We speculate this is because ULIRGs and starburst galaxies have different physical environments to mainsequence galaxies; while their sSFRs are much higher their densities are also significantly higher, hence CO is more easily shielded in these denser environments, leading to a rapid decline in  $\alpha_{CO}$ .

#### 5.2 Caveat – SDSS metallicities

Metallicity gradients of different amplitudes have been observed in galaxies similar to those studied here (Ho et al. 2015; Magrini et al. 2016; Tissera et al. 2016; Wuyts et al. 2016) meaning that the SDSS fibre spectroscopy for our galaxies, which only probes the central 3 arcsec, may not provide reliable metallicity measurements to use in the analysis of our [C II]/CO data. Star formation histories for these low-mass objects are known to be bursty while ongoing star formation activity is known to be inhomogeneous with activity unevenly scattered across the galaxy (Domínguez et al. 2015; Guo et al. 2015). Hence, to accurately measure metallicity gradients we would need IFU data to get accurate spatial sampling out to the extended regions of our galaxies without a priori information of the location of the H II regions. IFU spectroscopy would be essential to determine the accurate light-weighted, integrated metallicity measurements over the area of the galaxies probed by the IRAM and Herschel observations. Obtaining IFU spectroscopy of our targets



**Figure 6.** The new  $\alpha_{CO}$  conversion function as given in equation (25), which depends on both metallicity and  $\Delta$ (MS). As a comparison we show several commonly used metallicity-dependent  $\alpha_{CO}$  prescriptions.

may reduce the scatter found in the metallicity-dependent scaling relations and may further refine our conversion function.

Another source of uncertainty may be that the measured metallicity does not directly translate into the fraction of metals in dust, which does the shielding of the CO molecules from the radiation field. Rémy-Ruyer et al. (2014) show that the relation between metallicity and the dust-to-gas ratio may not be as simple and tight as suggested by studies based on smaller galaxy samples (e.g. Leroy et al. 2011). The  $\alpha_{CO}$  conversion function derived here could be improved further by including in the Bayesian analysis the measured dust-to-gas ratios, should those be available for the galaxy sample under consideration.

#### 5.3 Comparison with previous studies

Studies concerning the CO-to-H<sub>2</sub> conversion function have been ongoing for decades with a plethora of varying prescriptions; some of the earliest work was carried out by Solomon et al. (1987), Tielens & Hollenbach (1985) and van Dishoeck & Black (1988) and so on, to interpret our prescription, we compare it with a selection of other calibration derived using different methodologies. We plot our two-parameter conversion function in Fig. 6, where colour in the multicoloured filled surface denotes varying  $\Delta$ (MS). As can be seen, metallicity predominantly drives variations in our conversion function with  $\Delta$ (MS) playing a minor, though statistically important, role. Some well-established  $\alpha_{CO}$  prescriptions are also shown in Fig. 6.

We first compare our prescription to the single variable metallicity-dependent conversion functions of Schruba et al. (2012) and Genzel et al. (2012). These were derived by assuming a constant molecular gas depletion time and then using an inverse star formation law. Our prescription is approximately consistent with both around the high metallicity range, but then predicts different conversion factors for  $12 + \log(O/H) \lesssim 8.25$ . The divergence between the two aforementioned prescriptions is because in addition to us-

ing different galaxy samples as calibrators, they assumed different values for the molecular gas depletion time (1.8 and 1.0 Gyr, respectively). While diverging at the low metallicity end, these metallicity-dependent prescriptions would be adequate in the metallicity range covered by xCOLD GASS sample.

The novelty of our approach means that we are able to attribute the scatter found in these previous metallicity-only dependent relations to the position off the main sequence. Those systems with stronger radiation fields (due to higher  $\Delta$ (MS) values), at fixed metallicity, will have higher conversion factors. Also galaxies which are metal poor, at a fixed position on the main sequence, will have higher conversion factors than their metal-rich counterparts.

We next compare our prescription to another metallicitydependent conversion function based on the PDR modelling of Wolfire et al. (2010). The lowest metallicity employed in their grid of models was  $12 + \log(O/H) = 8.38$ . The trend in both conversion functions are in broad agreement for metallicities above  $12 + \log(O/H) = 8.38$  to solar, however they are offset from one another with our prescription predicting higher conversion factors. Their grid of models allowed for a varying ionization field [for which the sSFR/ $\Delta$ (MS) contributes towards] and varying metallicities, but the parametrization only involved metallicity.

We now move on to a comparison with Wilson (1995) and Arimoto et al. (1996) who both measured virialized masses of molecular clouds to infer the dependence of their conversion function with metallicity. The resulting prescription is also in broad agreement with the trends seen in the Leroy et al. (2011) sample, who used a dust-to-gas ratio method. As can be seen in Fig. 6, the trend in both conversion functions are in broad agreement for metallicities above  $12 + \log(O/H) = 8.25$  to solar. However, they are offset from one another with our prescription predicting conversion factors two to three times higher. We speculate that this is due to the integrated nature of our observations versus the highly resolved, cloud scale-resolution, of Wilson (1995) and Arimoto et al. (1996). On galaxy-wide scales, it is possible to see more diffuse H<sub>2</sub> molecular gas which is traced by [C II] and C I, as opposed to CO, hence the need for higher conversion factors to account for this.

Overall our prescription agrees well with others in the literature that have used integrated observations and assume a constant depletion time. Our prescription does not agree as well with those that have used (a) a dust-to-gas ratio method, (b) numerical modelling and (c) virialized gas mass estimates with observational resolution down to cloud scales. This is because our prescription accounts for the diffuse  $H_2$  gas, not found in individual clouds and GMCs, which is better traced by ionized and neutral carbon versus its molecular counterpart.

# 6 BRIDGING LOW- AND HIGH-REDSHIFT MOLECULAR GAS STUDIES

We apply our new prescription to the full xCOLD GASS sample [including the new low-mass galaxy sample and the higher mass objects presented in Saintonge et al. (2011a)] and the PHIBSS1 sample (Tacconi et al. 2013). Star formation rates, stellar masses, CO luminosities and redshifts for the PHIBSS1 sample are taken from Tacconi et al. (2013). Metallicities are estimated using the fundamental mass-metallicity relation from Mannucci et al. (2010). The aim of this is to investigate the consequences of our conversion function on gas scaling relations and how these change when going from a standard constant conversion factor to our prescription presented in equation (25). We do not include the DGS objects in this analysis as we are only interested in the statistical trends of the molecular



Figure 7. Distribution of conversion factors for the xCOLD GASS and PHIBSS1 galaxies. For the xCOLD GASS high-mass sample, the distribution is as expected centred on the Galactic value. The xCOLD GASS low-mass sample, due to their lower metallicities need higher conversion factors, similar to the PHIBSS1 galaxies that all have metallicities less than solar.

gas scaling laws; we need a complete sample of galaxies at different redshifts and so use the xCOLD GASS and PHIBSS1 samples. We leave a more thorough and statistically robust treatment of the scaling relations for a future publication.

We first plot in Fig. 7 a histogram showing the distribution of conversion factors for the high- and low-mass xCOLD GASS galaxies and the PHIBSS1 samples. For the original COLD GASS galaxies the distribution peaks slightly below the galactic value [~4.36 M<sub> $\odot$ </sub> (K km s<sup>-1</sup>)<sup>-1</sup>] with other values clustered closely around this, hence we expect the low-redshift molecular gas scaling relations to remain relatively unchanged for  $M_* > 10^{10}$ . However, for the lower mass galaxies the conversion factors for the high-redshift galaxies are at most a factor of two larger or smaller than the galactic conversion factor value so we do not expect a major change in the gas scaling laws at high redshifts.

#### 6.1 Molecular gas fractions up to $z \sim 2.0$

We present scaling relations for the CO-traced molecular gas mass fraction as a function of stellar mass, specific star formation rate and  $\Delta$ (MS) (from left to right) for the full xCOLD GASS and PHIBSS1 samples in Fig. 8. We aim to showcase our new prescription for  $\alpha_{CO}$  and so, for now, only use the CO-detected galaxies in both samples. In a future publication, a more thorough, quantitative, statistical treatment of the whole sample, including detections and non-detections, will be performed.

The top row in Fig. 8 presents the results obtained when using a constant galactic conversion factor; this had been previously explored for the COLD GASS sample in Saintonge et al. (2011a), only for galaxies with stellar masses  $> 10^{10} M_{\odot}$  and so we are extending the sample to include galaxies with stellar masses  $> 10^9 M_{\odot}$ . This relation for the PHIBSS1 sample was first presented in Tacconi et al. (2013) and Genzel et al. (2015). The bottom row presents the results obtained when our prescription is used. We fit quadratic polynomials to the xCOLD GASS data to qualitatively show the differences in the trends; we also present the product moment cor-

relation co-efficient and scatter for each fit, calculated using the using the PYTHON SciPy routine LINREGRESS.

As can been seen, the correlation with stellar mass remains unchanged for galaxies with  $M_*$  >  $10^{10}$  M $_{\odot}$  at low redshift as the standard galactic conversion factor is a good approximation to the conversion function predicted from this work. However, due to the emergence of lower metallicities in galaxies with stellar masses less than  $10^{10}$  M<sub> $\odot$ </sub> the trend changes. We start to see a flattening of the molecular gas mass fraction for stellar masses between 10<sup>9</sup> and  $10^{10}$  M<sub> $\odot$ </sub> for the low-redshift galaxies, which is in excellent agreement with the trends found in Grossi et al. (2016) and the star formation models of Krumholz, McKee & Tumlinson (2009), Krumholz, McKee & Tumlinson (2008) demonstrated in Lu, Mo & Lu (2015). In the star formation models, this flattening occurs as depletion time-scales are independent of stellar mass, something which we shall explore in Section 6.2. This flattening also validates part of the ideal gas regulator model (sSFR = constant; Lilly et al. 2013) for which no or very little dependence of gas fractions on stellar mass is expected, as we observe up to  $M_* \sim 10^{10} \,\mathrm{M_{\odot}}$ . This result is also of interest given the trend of increasing H I gas mass fraction with decreasing stellar mass, down to  $M_* \sim 10^9 \,\mathrm{M_{\odot}}$  (Brown et al. 2015), implying that low-mass galaxies are less efficient at converting their H I gas reservoirs into molecular gas. For the high-redshift objects the trend of increasing molecular gas fraction with decreasing stellar mass is still evident; this is true across all redshifts for  $M_* > 10^{10}$ (Tacconi et al. 2013). The decreasing gas fractions as stellar mass increases, at all redshifts, is driven by the flattening of the SFR- $M_*$ relation at high stellar masses.

The correlation with specific star formation rate strengthens when using the prescription presented here. A tight correlation between molecular gas and star formation is expected, confirming that the variable  $\alpha_{CO}$  presented here outperforms a constant Galactic value. This is in agreement with the relations found in Saintonge et al. (2016) showing that star formation activity in a galaxy is controlled by the total available gas. Interestingly, the high-redshift galaxies simply extend the trends found from the low-redshift sample.

We also plot the correlation with  $\Delta(MS)$  and find similar results to the trends with specific star formation rate for local universe galaxies. This is expected as sSFR<sub>MS</sub> is roughly constant in the local universe and therefore  $\Delta(MS) \propto$  sSFR at low redshift. The high-redshift galaxies are offset from the trend seen in the lowredshift sample as a direct consequence of the evolution of sSFR on the main sequence with redshift (e.g. Karim et al. 2011) and the increase in the gas supply rate.

#### 6.2 Molecular gas depletion times up to $z \sim 2.0$

We present scaling relations for the CO-traced molecular gas depletion times, where  $t_{dep} = M_{H_2}/SFR$ , as a function of stellar mass, specific star formation rate and  $\Delta$ (MS) for the full xCOLD GASS and PHIBSS1 samples in Fig. 9. While a positive correlation between  $t_{dep}$  and  $M_*$  is observed when applying a Galactic conversion factor, this trend becomes statistically insignificant with a correlation coefficient of 0.289 once our conversion function is used. The important consequence of this is that  $t_{dep}$  (or equivalently, star formation efficiency) does not depend on stellar mass, as also seen in the PHIBSS1 sample. This is all in agreement with previous trends found in the low- and high-redshift universe (Leroy et al. 2013; Tacconi et al. 2013; 2017; Huang & Kauffmann 2014; Santini et al. 2014; Sargent et al. 2014; Genzel et al. 2015). This important result validates part of the equilibrium model (Davé et al. 2012; Lilly



**Figure 8.** *Top row:* scaling relations between molecular gas mass fraction and  $M_*$ , sSFR and  $\Delta(MS)$  (from left to right) for the full xCOLD GASS and PHIBSS1 samples, when using a constant Galactic conversion factor. The red lines are second-order fits to the xCOLD GASS data, with the correlation coefficient and the 1 $\sigma$  scatter also given. *Bottom row:* same scaling relations as above, but using the  $\alpha_{CO}$  conversion function presented in equation (25).

et al. 2013) which states that gas depletion times are independent or have very little dependence on stellar mass.

The correlation with sSFR, albeit weaker, is in agreement with the relations found in Saintonge et al. (2011b), and confirms the conclusion from Bothwell et al. (2014) that it is robust against the choice of a specific metallicity-dependent  $\alpha_{CO}$  conversion function. Our shallower trend is expected because our prescription is dependent on  $\Delta$ (MS), which is closely linked to sSFR. The trend observed here is in excellent agreement with that found in Hunt et al. (2015). Moreover, the high-redshift galaxies are offset as previously reported in Saintonge et al. (2012). The trend between t<sub>dep</sub> and sSFR is redshift independent once accounting for the redshift evolution of the main sequence (see bottom right panel of Fig. 9 and Genzel et al. 2015; Tacconi et al. 2017). This suggests that the process of star formation on the main sequence is driven by similar physical mechanisms across cosmic time, independently of stellar mass.

Finally, we plot in the left-hand panel of Fig. 10 CO (1–0) luminosity versus star formation rate for the whole xCOLD GASS sample. Low-redshift galaxies with stellar mass  $< 10^{10} M_{\odot}$  have much lower CO luminosities per unit star formation than their higher mass counterparts. Is this due to a higher star formation efficiency in lower mass galaxies or due to the photodissociation of CO leading to higher conversion factors? To this end we plot  $M_{\rm H_2}$  versus star formation rate, using our conversion function. The divergence away from the trend in the left plot is accounted for by the photodissoci-

ation of CO and low-mass galaxies are, on average, as efficient as higher mass galaxies at forming stars.

It now becomes apparent why our trend for the depletion time versus sSFR, presented in Fig. 9, is in agreement with that presented in Hunt et al. (2015); their conversion function was derived under the assumption that the linear relation between  $L_{CO}$  and SFR observed in high-mass, solar metallicity galaxies extends to the regime of low-mass, low metallicity galaxies, with any deviations being attributed to CO photodissociation effects. The results of this study find this assumption to have been correct.

#### **7 SUMMARY AND CONCLUSIONS**

We present here results from xCOLD GASS, a legacy survey of CO (1–0) observations form the IRAM observatory, combined with *Herschel* observations of ionized carbon. We provide the first scaling relations for the integrated  $L_{\rm [CII]}/L_{\rm CO(1-0)}$  ratio as a function of several galaxy parameters for a sample of low metallicity galaxies over 2 dex in  $L_{\rm [CII]}/L_{\rm CO(1-0)}$ . From this, we corrected for contaminant [C II] emission from non-molecular phases of the ISM and provide scaling relations for the molecular region  $L_{\rm [CII]}/L_{\rm CO(1-0)}$  ratio.

We show that the integrated and molecular-only  $L_{\rm [C\,II]}/L_{\rm CO\,(1-0)}$  ratio depends most strongly on parameters which describe the strength of the UV radiation field and the ability of the CO molecule to shield itself, via dust, from the UV radiation impinging on the surface of



Figure 9. Scaling relations for molecular gas depletion time using either a constant Galactic conversion factor (top row) or the new two-parameter conversion function (bottom row). Symbols and lines are as described in Fig. 8.



**Figure 10.** *Left:* CO luminosities of the full xCOLD GASS sample as a function of SFR, with the colour of each point denoting stellar mass. *Right:* relation between  $M_{H_2}$  and star formation rate, using equation (25) as the conversion function; the lowest mass galaxies which appeared under luminous in CO in the left-hand plot follow the same linear trend as the higher mass galaxies, indicating that they are on average equally efficient at forming stars.

the molecular regions deep inside the PDR. A clear dependence on the colour (NUV-*r*) of the galaxies, specific star formation rate, UV field hardness, gas-phase metallicity and  $\Delta$ (MS) is observed. On the other hand, the  $L_{[C II]}/L_{CO(1-0)}$  ratio does not depend strongly on large-scale parameters which describe the mass and structural properties of the galaxies.

Through a Bayesian analysis we establish that only two parameters, metallicity and  $\Delta$ (MS), are needed to robustly parametrize

a prescription for variations in  $L_{\rm [C\,II]}/L_{\rm CO\,(1-0)}$  across our combined xCOLD GASS and DGS sample. We use our parametrization of  $L_{\rm [C\,II]}/L_{\rm CO\,(1-0)}$ , alongside radiative transfer modelling, to present a novel conversion function where

$$\log \alpha_{\rm CO}(\pm 0.165 \text{ dex}) = 15.623 - 1.732[12 + \log(O/H)] + 0.051 \log \Delta(MS).$$
(26)

The prescription should only be applied to galaxies with 7.9 < 12 + log (O/H) < 8.8 and -0.8 < log  $\Delta$ (MS) < 1.3 and which are not in the high-pressure 'merger' regime where a lower  $\alpha_{\rm CO}$  value should be use. Our  $\alpha_{\rm CO}$  conversion function is consistent with previous metallicity-only prescriptions, however we are now able to attribute deviations from this relation to a second-order dependence on the offset of a galaxy from the star-forming main sequence. The main interest of this new  $\alpha_{\rm CO}$  conversion function is that it is calibrated independently of any assumption on the molecular gas depletion time-scale, making it perfectly suited for the study of gas and star formation scaling relations.

We apply the new  $\alpha_{CO}$  to the full xCOLD GASS and PHIBSS1 samples and investigate such gas scaling relations. We find a complete flattening of the relation between molecular gas mass fraction and stellar mass as stellar mass decreases; this is expected based on the linearity of the  $M_*$ -SFR relation in this mass regime, and the close relation between molecular gas and star formation. As previously reported, there are systematic variations of the gas depletion time-scale across the low- and high-redshift galaxy populations, although the dependence on sSFR is slightly weaker than previously reported. The depletion time, however, does not vary significantly with stellar mass. Instead, the low  $L_{CO}$ /SFR ratios in low-mass galaxies are entirely due to photodissociation of CO, meaning that on average lower mass galaxies are equally efficient at forming stars than their high-mass counterparts.

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# REFERENCES

- Abazajian K. N. et al., 2009, ApJS, 182, 543
- Abdo A. A., Ackermann M., Ajello M., Baldini L., Ballet J., Barbiellini G., Fermi/LAT Collaboration 2010, ApJ, 710, 133
- Accurso G., Saintonge A., Bisbas T. G., Viti S., 2017, MNRAS, 464, 3315 Akaike H., 1981, J. Econ., 16, 3
- Arimoto N., Sofue Y., Tsujimoto T., 1996, PASJ, 48, 275
- Asplund M., Grevesse N., Sauval A. J., Scott P., 2009, ARA&A, 47, 481

Bisbas T. G., Bell T. A., Viti S., Yates J., Barlow M. J., 2012, MNRAS, 427, 2100

Bisbas T. G., Papadopoulos P. P., Viti S., 2015, ApJ, 803, 37

Bolatto A. D., Wolfire M., Leroy A. K., 2013, ARA&A, 51, 207

Boselli A., Lequeux J., Gavazzi G., 2002, A&A, 384, 33

- Bothwell M. S. et al., 2014, MNRAS, 445, 2599
- Bouché N. et al., 2010, ApJ, 718, 1001
- Brown T., Catinella B., Cortese L., Kilborn V., Haynes M. P., Giovanelli R., 2015, MNRAS, 452, 2479
- Carter M. et al., 2012, A&A, 538, A89
- Catinella B., Schiminovich D., Kauffmann G., Fabello S., Wang J., 2010, MNRAS, 403, 683
- Catinella B. et al., 2013, MNRAS, 436, 34
- Clark P. C., Glover S. C. O., 2015, MNRAS, 452, 2057
- Cormier D. et al., 2014, A&A, 564, A121
- Davé R., Finlator K., Oppenheimer B. D., 2012, MNRAS, 421, 98
- Davis T. A. et al., 2014, MNRAS, 444, 3427
- Dickman R. L., Snell R. L., Schloerb F. P., 1986, ApJ, 309, 326
- Domínguez A., Siana B., Brooks A. M., Christensen C. R., Bruzual G., Stark D. P., Alavi A., 2015, MNRAS, 451, 839
- Ercolano B., Barlow M. J., Storey P. J., Liu X.-W., 2003, MNRAS, 340, 1136
- Ercolano B., Barlow M. J., Storey P. J., 2005, MNRAS, 362, 1038
- Foster J. B., Mandel K. S., Pineda J. E., Covey K. R., Arce H. G., Goodman A. A., 2013, MNRAS, 428, 1606
- Galametz M. et al., 2010, A&A, 518, L55
- Genzel R., Tacconi L. J., Combes F., Bolatto A., Neri R., Sternberg A., 2012, ApJ, 746, 69
- Genzel R. et al., 2015, ApJ, 800, 20
- Giovanelli R. et al., 2005, AJ, 130, 2598
- Goodman J., Weare J., 2010, Commun. Appl. Math. Comput. Sci., 5, 65
- Grenier I. A., Casandjian J.-M., Terrier R., 2005, Science, 307, 1292
- Grossi M. et al., 2016, A&A, 590, A27
- Guo K., Zheng X. Z., Wang T., Fu H., 2015, ApJ, 808, L49
- Ho I.-T., Kudritzki R.-P., Kewley L. J., Zahid H. J., Dopita M. A., Bresolin F., Rupke D. S. N., 2015, MNRAS, 448, 2030
- Huang M.-L., Kauffmann G., 2014, MNRAS, 443, 1329
- Hughes T. M. et al., 2015, A&A, 575, A17
- Hunt L. K. et al., 2015, A&A, 583, A114
- Israel F. P., 1997, A&A, 328, 471
- Israel F. P., Baas F., 2003, A&A, 404, 495
- Karim A. et al., 2011, ApJ, 730, 61
- Kauffmann G. et al., 2003, MNRAS, 341, 33
- Kaufman M. J., Wolfire M. G., Hollenbach D. J., Luhman M. L., 1999, ApJ, 527, 795
- Kelly B. C., 2007, ApJ, 665, 1489
- Kennicutt R. C., Evans N. J., 2012, ARA&A, 50, 531
- Kewley L. J., Ellison S. L., 2008, ApJ, 681, 1183
- Kramer C. et al., 2013, A&A, 553, A114
- Krumholz M. R., McKee C. F., Tumlinson J., 2008, ApJ, 689, 865
- Krumholz M. R., McKee C. F., Tumlinson J., 2009, ApJ, 693, 216
- Leitherer C. et al., 1999, ApJS, 123, 3
- Leitherer C., Ortiz Otálvaro P. A., Bresolin F., Kudritzki R.-P., Lo Faro B., Pauldrach A. W. A., Pettini M., Rix S. A., 2010, ApJS, 189, 309
- Leroy A. K., Walter F., Brinks E., Bigiel F., de Blok W. J. G., Madore B., Thornley M. D., 2008, AJ, 136, 2782
- Leroy A. K. et al., 2009, AJ, 137, 4670
- Leroy A. K. et al., 2011, ApJ, 737, 12
- Leroy A. K. et al., 2013, AJ, 146, 19
- Lilly S. J., Carollo C. M., Pipino A., Renzini A., Peng Y., 2013, ApJ, 772, 119
- Lu Z., Mo H. J., Lu Y., 2015, MNRAS, 450, 606
- Madden S. C., Poglitsch A., Geis N., Stacey G. J., Townes C. H., 1997, ApJ, 483, 200
- Madden S. C., Rémy-Ruyer A., Galametz M., Cormier D., Lebouteiller V., Galliano F., 2013, PASP, 125, 600
- Magnelli B. et al., 2012, A&A, 548, A22

- Magrini L., Coccato L., Stanghellini L., Casasola V., Galli D., 2016, A&A, 588, A91
- Makrymallis A., Viti S., 2014, ApJ, 794, 45
- Mandel K. S., Narayan G., Kirshner R. P., 2011, ApJ, 731, 120
- Mannucci F., Cresci G., Maiolino R., Marconi A., Gnerucci A., 2010, MNRAS, 408, 2115
- Martin D. C., Fanson J., Schiminovich D., Morrissey P., Friedman P. G., Barlow T. A., 2005, ApJ, 619, L1
- Mookerjea B. et al., 2011, A&A, 532, A152
- Oberst T. E. et al., 2006, ApJ, 652, L125
- Obreschkow D., Rawlings S., 2009, MNRAS, 394, 1857
- Ott S., 2010, in Mizumoto Y., Morita K.-I., Ohishi M., eds, ASP Conf. Ser. Vol. 434, Astronomical Data Analysis Software and Systems XIX. Astron. Soc. Pac., San Francisco, p. 139
- Pettini M., Pagel B. E. J., 2004, MNRAS, 348, L59 (PP04)
- Pilbratt G. L., Riedinger J. R., Passvogel T., Crone G., Doyle D., Gageur U., 2010, A&A, 518, L1
- Pineda J. L., Langer W. D., Velusamy T., Goldsmith P. F., 2013, A&A, 554, A103
- Poglitsch A., Krabbe A., Madden S. C., Nikola T., Geis N., Johansson L. E. B., Stacey G. J., Sternberg A., 1995, ApJ, 454, 293
- Poglitsch A., Waelkens C., Geis N., Feuchtgruber H., Vandenbussche B., Rodriguez L., Krause O., 2010, A&A, 518, L2
- Rémy-Ruyer A., Madden S. C., Galliano F., Galametz M., Takeuchi T. T., Asano R. S., 2014, A&A, 563, A31
- Röllig M., Ossenkopf V., Jeyakumar S., Stutzki J., Sternberg A., 2006, A&A, 451, 917
- Saintonge A., Kauffmann G., Kramer C., Tacconi L. J., Buchbender C., Catinella B., Fabello S., 2011a, MNRAS, 415, 32
- Saintonge A., Kauffmann G., Wang J., Kramer C., Tacconi L. J., Buchbender C., Catinella B., 2011b, MNRAS, 415, 61
- Saintonge A. et al., 2012, ApJ, 758, 73
- Saintonge A. et al., 2013, ApJ, 778, 2
- Saintonge A. et al., 2016, MNRAS, 462, 1749
- Sandstrom K. M. et al., 2012, ApJ, 744, 20
- Sandstrom K. M. et al., 2013, ApJ, 777, 5
- Santini P. et al., 2014, A&A, 562, A30 Sargent M. T. et al., 2014, ApJ, 793, 19
- Schruba A. et al., 2012, AJ, 143, 138
- Schwarz G., 1978, Ann. Stat., 6, 461
- Scoville N. Z. 2013, Evolution of Star Formation and Gas. Cambridge Univ.
  - Press, Cambridge, p. 491

- Shetty R., Kelly B. C., Bigiel F., 2013, MNRAS, 430, 288
- Solomon P. M., Rivolo A. R., Barrett J., Yahil A., 1987, ApJ, 319, 730
- Solomon P. M., Downes D., Radford S. J. E., Barrett J. W., 1997, ApJ, 478, 144
- Stacey G. J., Geis N., Genzel R., Lugten J. B., Poglitsch A., Sternberg A., Townes C. H., 1991, ApJ, 373, 423
- Stoughton C. et al., 2002, AJ, 123, 485
- Strong A. W., Mattox J. R., 1996, A&A, 308, L21
- Tacconi L. J. et al., 2013, ApJ, 768, 74
- Tacconi L. J. et al., 2017, ApJ, preprint (arXiv:1702.01140)
- Tielens A. G. G. M., Hollenbach D., 1985, ApJ, 291, 722
- Tissera P. B., Pedrosa S. E., Sillero E., Vilchez J. M., 2016, MNRAS, 456, 2982
- Tremonti C. A. et al., 2004, ApJ, 613, 898
- van Dishoeck E. F., Black J. H., 1986, ApJS, 62, 109
- van Dishoeck E. F., Black J. H., 1988, ApJ, 334, 771
- Wang J., Overzier R., Kauffmann G., von der Linden A., Kong X., 2010, MNRAS, 401, 433
- Whitaker K. E., van Dokkum P. G., Brammer G., Franx M., 2012, ApJ, 754, L29
- White S. D. M., Frenk C. S., 1991, ApJ, 379, 52
- Wilson C. D., 1995, ApJ, 448, L97
- Wolfire M. G., Hollenbach D., McKee C. F., 2010, ApJ, 716, 1191
- Wright E. L., Eisenhardt P. R. M., Mainzer A. K., Ressler M. E., Cutri R. M., Jarrett T., 2010, AJ, 140, 1868
- Wuyts E. et al., 2016, ApJ, 827, 74
- Young J. S., Scoville N. Z., 1991, ARA&A, 29, 581

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