

# The nature of the faint low-frequency radio source population

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Accepted 2017 February 16. Received 2017 February 15; in original form 2016 December 17

## ABSTRACT

We present a multiwavelength study into the nature of faint radio sources in a deep radio image with the Giant Meterwave Radio Telescope at 612 MHz covering 1.2 deg<sup>2</sup> of the ELAIS N1 region. We detect 2800 sources above 50  $\mu\text{Jy beam}^{-1}$ . By matching to multiwavelength data, we obtain a redshift estimate for 63 per cent, with 29 per cent based on spectroscopy. For 1526 of the sources with redshifts, we use radio and X-ray luminosity, optical spectroscopy, mid-infrared colours and 24  $\mu\text{m}$  and IR to radio flux ratios to search for the presence of an active galactic nucleus (AGN). The analysis reveals a rapid change in the population as flux density decreases from  $\sim 500 \mu\text{Jy}$  to  $\sim 100 \mu\text{Jy}$ . We find that 80.3 per cent of the objects show no evidence of AGN and have multiwavelength properties consistent with radio emission from star-forming galaxies (SFG). We classify 11.4 per cent as radio-quiet (RQ) AGN and the remaining 8.3 per cent as radio-loud (RL) AGN. The redshift of all populations extends to  $z > 3$  with a median of  $\sim 1$ . The median radio and far-IR luminosity increases systematically from SFG, to RQ AGN and RL AGN. The median  $q_{24 \mu\text{m}}$  for SFG,  $0.89 \pm 0.01$ , is slightly below that for RQ AGN,  $1.05 \pm 0.03$ , and both differ substantially from the value for RL AGN of  $-0.06 \pm 0.07$ . However, SFG and RQ AGN show no significant difference in far-IR/radio ratios and have statistically indistinguishable star formation rates inferred from radio and far-IR luminosities. We conclude that radio emission from host galaxies of RQ AGN in this flux density regime results primarily from star formation activity.

**Key words:** galaxies: active – infrared: galaxies – radio continuum: galaxies.

## 1 INTRODUCTION

The interplay between star formation and black hole accretion is one of the central issues in galaxy evolution today. Tight correlations found between black hole mass and both stellar bulge mass (Kormendy et al. 1998; McLure & Dunlop 2002) and velocity dispersion (Gebhardt et al. 2000; Tremaine et al. 2002) in galaxies in the local universe indicate that the formation and growth of galaxies is closely linked to the growth of their central black holes.

Both accretion activity on the central black holes and star formation in the discs of galaxies create radio synchrotron emission. In this context, the study of the faint radio universe has become a very active field of research as the increased sensitivity of radio telescopes has enabled  $\mu\text{Jy}$ -rms-level imaging over extended fields (Luchsinger et al. 2015), probing radio emission from galaxies to significant redshift. Understanding the properties of sources in the faint radio sky and their cosmic evolution is thus important

to understanding of the links between black hole accretion and star formation activity in the universe (Casey et al. 2009).

Whereas the bright (i.e.  $> 1 \text{ mJy}$  at 1.4 GHz) radio sky is dominated by the emission driven by ‘radio-loud’ AGNs (RL AGN) (e.g. Prandoni et al. 2001; Seymour et al. 2008; Padovani et al. 2009), deep radio surveys probe both active galactic nuclei (AGNs) and star-forming galaxies (SFGs), with SFGs becoming increasingly important at fainter flux densities. Recent work by Padovani et al. (2009) and Bonzini et al. (2013) has revealed a third population of sources at faint flux densities, the ‘radio-quiet’ AGN (RQ AGN). Giroletti & Panessa (2009) proposed that RQ AGN represent scaled-down versions of RL AGN in mini radio jets. On the other hand, Kimball et al. (2011) and Padovani et al. (2011) argued that the radio emission of RQ AGN comes from star formation in the host galaxy.

Radio flux density measurements at angular resolutions insufficient to resolve the structure of the galaxy cannot distinguish between synchrotron emission from AGN or star formation. However, multiwavelength observations from the X-ray to the millimetre can reveal the presence of AGN, including highly obscured ones. Rawlings et al. (2015) divided faint radio samples into sources powered

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by AGN or by star formation through their infrared SEDs, X-ray luminosities and IRAC colours satisfying the Donley et al. (2012) criterion. Bonzini et al. (2013) proposed a classification scheme that is an upgrade of that used by Padovani et al. (2011) through a combination of radio, infrared and X-ray data in the ECDFS.

In this work, we present a multiwavelength investigation to classify radio sources from deep 612 MHz observations with the GMRT of the ELAIS N1 field covering an area of  $1.2 \text{ deg}^2$  to a RMS sensitivity of  $10 \mu\text{Jy beam}^{-1}$ . These observations are the most sensitive images of the sky at this frequency to date. Garn et al. (2008) presented a GMRT image of ELAIS N1 at 610 MHz covering  $\sim 9 \text{ deg}^2$ , constructed from a mosaic of 19 pointings. This comprised a smaller central region of 4 pointings with an rms of  $\sim 40 \mu\text{Jy beam}^{-1}$  and the remaining 15 pointings with an rms of  $\sim 70 \mu\text{Jy beam}^{-1}$ . Grant et al. (2010) imaged  $15 \text{ deg}^2$  at 1.4 GHz with the Dominion Radio Astrophysical Observatory to an rms of  $55 \mu\text{Jy beam}^{-1}$  in total intensity and  $45 \mu\text{Jy beam}^{-1}$  in linear polarization. While stacking analysis of such deep radio images based on optical–IR catalogues has allowed statistical correlations such as the average radio–IR correlation to be explored to lower radio flux densities (Garn & Alexander 2009), direct studies of the radio selected population to  $\mu\text{Jy}$  sensitivities, ultra-deep radio imaging.

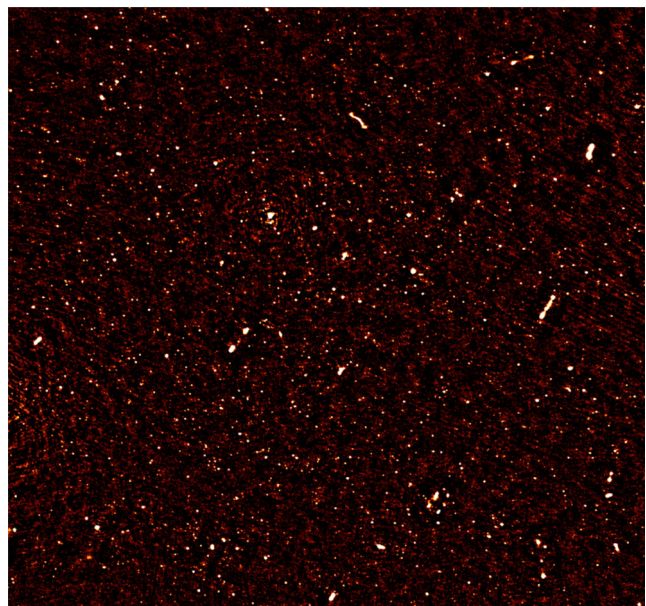
The paper is organized as follows. We describe the radio observations and the multiwavelength data and sample selection in Section 2. The multiwavelength AGN diagnostics are described in Section 5, and the properties of the classified sources in Section 6. We summarize our results in Section 7. For calculation of intrinsic source properties, we assume a flat cold dark matter ( $\Lambda\text{CDM}$ ) cosmology with  $\Omega_\Lambda = 0.7$ ,  $\Omega_m = 0.3$  and  $H_0 = 70 \text{ km s}^{-1} \text{ Mpc}^{-1}$ .

## 2 MULTIWAVELENGTH DATA

### 2.1 Radio data

The GMRT observations of the ELAIS N1 field were obtained during several observing runs from 2011 to 2013. Observations were carried out for seven positions arranged in a hexagonal pattern centred on  $\alpha = 16^{\text{h}} 10^{\text{m}} 30^{\text{s}}$ ,  $\delta = 54^\circ 35' 00''$ , covering an area of  $1.2 \text{ deg}^2$ . Each position was observed for  $\sim 30 \text{ h}$  in three 10-h sessions. The total bandwidth was 32 MHz, split into 256 spectral channels centred at 612 MHz in four polarization states. Observations of 3C286 were made twice in each observing session, and were used to calibrate the flux scale, band pass and absolute polarization position angle. Time-dependent gains and on-axis polarization leakage corrections were measured by frequent observations of the secondary calibrator J1549+506.

The visibility data were calibrated, imaged and mosaicked using the CASA processing software. Images were constructed for each pointing out to the 10 per cent point of the primary beam using multifrequency synthesis with two Taylor series terms. The effect of the three-dimensional beam over the wide field of view was corrected using w-projection. Following initial calibration, the visibilities for each pointing were run through several iterations of self-calibration, with the gain solution time interval decreasing and the depth of the clean component sky model increasing with each iteration. The self-calibrated individual field images were combined into a mosaic in the image plane using the CASA linear mosaic tool. The RMS noise in the resulting total intensity mosaic image is  $10.3 \mu\text{Jy beam}^{-1}$  before primary beam correction. The RMS was measured by fitting a normal error function to distribution of negative map deflections from the entire mosaic. By comparison, the RMS in the Stokes  $Q$  and  $U$  images is



**Figure 1.** Image of the ELAIS N1 GMRT 612 MHz mosaic centred at  $\alpha = 16^{\text{h}} 10^{\text{m}} 30^{\text{s}}$ ,  $\delta = 54^\circ 35' 00''$ . This image is 47 arcmin on each side, showing the central  $\sim 0.6 \text{ deg}^2$  of the  $1.2 \text{ deg}^2$  mosaic. The RMS noise is  $10.3 \mu\text{Jy beam}^{-1}$ . The image shows a small number of bright classical radio galaxies with double-lobed and jet morphologies. However, the vast majority of the radio sources are fainter objects that are unresolved at the  $\sim 5 \text{ arcsec}$  angular resolution.

$7.3 \mu\text{Jy beam}^{-1}$ . The RMS noise in the total intensity mosaic is thus only slightly above the thermal noise limit. The excess noise may be attributed to a combination of confusion and residual clean artefacts.

The angular resolution of the mosaic radio image is  $6.1 \times 5.1 \text{ arcsec}$ . An image of the central  $0.6 \text{ deg}^2$  of the mosaic is shown in Fig. 1.

The catalogue of radio sources was extracted using the AIPS SAD automated source finding program and consists of 2800 radio sources with peak flux density above the  $5\sigma$  threshold. Among the brightest objects in the sample, is the very small fraction of the total ( $\sim 3$  per cent) that exhibit classical extended radio-galaxy, AGN-driven jet morphology (Taylor & Jagannathan 2016). The vast majority are compact sources that are unresolved at the resolution of the observations. The flux densities for compact individual sources were derived from the 2-D Gaussian fits from AIPS SAD. Total flux densities for the small number of extended multicomponent jet-lobe sources were taken to be the sum of the flux densities of the individual components. The full catalogue, including source counts and polarization information, will be published in a subsequent paper. Here, we focus on matching with the multiwavelength data sets to investigate the nature of the radio sources.

### 2.2 SERVS data fusion and ancillary data

The Spitzer Extragalactic Representative Volume Survey (SERVS, Mauduit et al. 2012) is a warm *Spitzer* survey that imaged  $18 \text{ deg}^2$  using the IRAC1  $3.6 \mu\text{m}$  and IRAC2  $4.5 \mu\text{m}$  bands. The main aim of the survey was to enable the study of galaxy evolution as a function of environment from  $z \sim 5$  to the present day through the first extragalactic survey that is both large enough and deep enough to put rare objects such as luminous quasars and galaxy clusters at  $z \geq 1$  into their cosmological context. SERVS sources were separately

extracted in IRAC1 and IRAC2 images and single-band detections were merged into a two-band (hereafter IRAC12) catalogue using a search radius of 1 arcsec. The rms noise of both the IRAC1 and IRAC2 images is  $0.5 \mu\text{Jy}$  and the catalogue completeness limit is thus  $2 \mu\text{Jy}$  in both bands.

SERVS overlaps with several other surveys at optical, near-through far-infrared, sub-millimeter. The SERVS Data Fusion<sup>1</sup> (Vaccari et al. 2010; Vaccari 2015) matches SERVS IRAC12 sources against a large suite of multiwavelength data using a search radius of 1 arcsec. In particular, in our work, we have used the following data sets included within the SERVS Data Fusion:

- (i) SDSS DR12 Optical Photometry (Alam et al. 2015)
- (ii) INT WFC Deep Optical Photometry (González-Solares et al. 2011)
- (iii) 2MASS PSC Near-IR Photometry (Cutri et al. 2003)
- (iv) UKIDSS DXS Deep Near-IR Photometry (Lawrence et al. 2007)
- (v) Spitzer Wide-Area Infrared Survey 4-band IRAC Photometry and 3-band MIPS Photometry (Lonsdale et al. 2003; Vaccari 2015)
- (vi) SWIRE Photometric Redshifts (Rowan-Robinson et al. 2008, 2013, 2016)
- (vii) Spectroscopic redshifts from the literature (Serjeant et al. 2004; Hernán-Caballero et al. 2009; Trichas et al. 2009; Alam et al. 2015) including newly obtained measurements from BOSS/SDSS-III better detailed in Section 2.3.

In future papers, we will improve our analysis by making use of the multiwavelength data base produced by the Herschel Extragalactic Legacy Project (Vaccari 2016, HELP), including an improved source extraction at SPIRE Griffin et al. (2010) wavelengths using the `XID+` software by Hurley et al. (2017).

### 2.3 BOSS/SDSS spectroscopy

The Baryon Oscillation Spectroscopic Survey (BOSS) was the primary dark-time survey of SDSS-III (Eisenstein et al. 2011), the third phase of the Sloan Digital Sky Survey (SDSS; York et al. 2000). BOSS observed 1.5 million massive galaxies and 150 000 quasars to measure the distance–redshift relation  $d_A(z)$  and the Hubble parameter  $H(z)$  with percent-level precision out to  $z = 0.7$  and  $z \simeq 2.5$ , using the well-established techniques that led to the first detection of the baryon acoustic oscillations (BAO) feature (Cole et al. 2005; Eisenstein et al. 2005). BOSS was designed to measure the scale of the BAO in the clustering of matter over a larger volume than the combined efforts of all previous spectroscopic surveys of large-scale structure. BOSS consists of two spectroscopic surveys, both of which have been carried out over an area of  $10\,000 \text{ deg}^2$ . The first survey observed 1.5 million luminous red galaxies ( $i < 19.9$ ) to measure BAO to redshifts  $z < 0.7$ , while the second one will observe neutral hydrogen in the Ly  $\alpha$  forest in more than 150 000 quasar spectra ( $g < 22$ ) to constrain BAO at  $z \sim 2.5$ .

From 2012 onwards, a series of plates were added to the SDSS-III program to observe ancillary science programs. We were granted four BOSS plates to obtain spectra for the radio sources detected by our GMRT observations as well as by other shallower radio surveys in the ELAIS N1 field. Observations were obtained by the SDSS team and their reduction using the default BOSS spectroscopic pipeline has been made publicly available as part of the SDSS DR12. In our work, however, due to the large number of

sources near the centre of the BOSS plate, a bespoke data reduction scheme was adopted to optimize the spectroscopic redshift accuracy (Tarr et al., in preparation).

### 2.4 X-ray data

The only astrophysical sources that reach very high X-ray luminosities are AGNs. Usually a cut in the unabsorbed X-ray luminosity at  $10^{42} \text{ erg s}^{-1}$  is considered as a threshold dividing AGNs and SFGs (see Szokoly et al. 2004). In this work, we combined shallow *Chandra* observations of the whole GMRT field produced by Trichas et al. (2009) using the Imperial College London pipeline (Georgakakis et al. 2008; Laird et al. 2009) with deep *Chandra* observations of a small area ( $0.15 \text{ deg}^2$ ) of the central region of the field by Manners et al. (2003).

## 3 MULTIWAVELENGTH CROSS-MATCHING

We matched the GMRT catalogue against SERVS IRAC12 positions using a variable search radius equal to three times the estimated astrometric error. Radio position errors for individual sources from AIPS SAD fitting algorithm are typically a few tenths of an arcsec. SERVS astrometric error of 0.15 arcsec was assumed based on SERVS versus 2MASS cross-matching. From an initial matching of the GMRT and SERVS catalogues, we computed the median astrometric offsets between the two catalogues of  $-0.434 \pm 0.014$  and  $+0.303 \pm 0.013$  arcsec in RA and DEC, respectively. We applied these corrections to the radio positions before performing the final cross-matching. The SERVS matches were identified using a search radius of three times the combined astrometric error on the coordinate comparison. Given the sub-arcsec accuracy of the positions, in virtually all cases where a match was found this resulted in a unique identification. In the few cases of a multiple SERVS objects in error circle, we took the nearest object as the identification.

SERVS identifications were obtained for 2369 out of 2800 (or 85 per cent) of our radio sources. The RMS of the coordinate differences for the matched sources is  $\sim 0.5$  arcsec in both RA and DEC. Of the 15 per cent of GMRT objects that are not matched in the SERVS catalogue, 203 (7.3 per cent) are affected by diffraction spikes due to bright objects and/or by source blending due to confusion, and therefore no conclusive identifications can be made. This can partly be addressed by carrying out multiband forced photometry with e.g. the Tractor code (Lang, Hogg & Schlegel 2016), as currently underway within the SERVS team (Nyland et al., in preparation). Another 109 objects (3.9 per cent) have faint counterparts in the SERVS images, but have no entry in the SERVS catalogue. The remaining 124 unidentified objects (4.4 per cent) have no infrared counterpart in the SERVS image. These objects are examples of the recently identified class of Infra-red Faint Radio Sources (Norris et al. 2006; Garn & Alexander 2008).

Table 1 summarizes the results of the cross-matching against SERVS and the other multiwavelength data sets. The fraction of identifications in either SERVS IRAC1 or IRAC2 is 85 per cent, while 80 per cent have counterparts in both IRAC1 and IRAC2 and 39 per cent of our radio sample has counterparts in all four IRAC bands. MIPS 24 detections are found for 60 per cent. In addition, 3.3 per cent of our sample has an X-ray detection in either the shallow or deep X-ray (2.5 per cent and 0.8 per cent, respectively).

## 4 REDSHIFTS

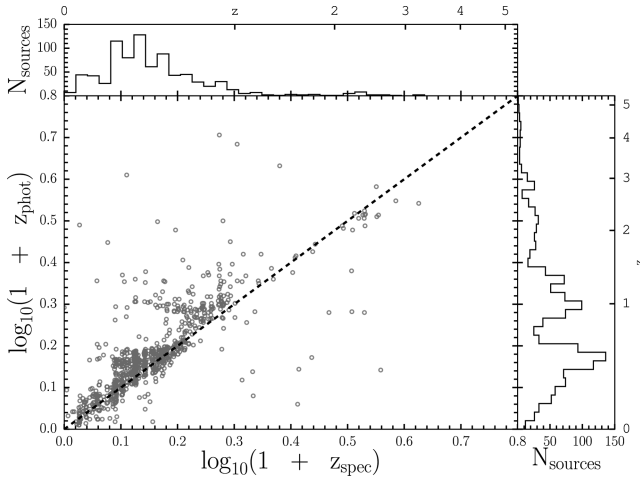
The majority of the spectroscopic redshifts for our sample were obtained with BOSS. The BOSS spectral classification and redshift

<sup>1</sup> <http://www.mattiavaccari.net/df>



**Table 1.** The GMRT cross-matching statistics. The table shows statistics from our new cross-matching.

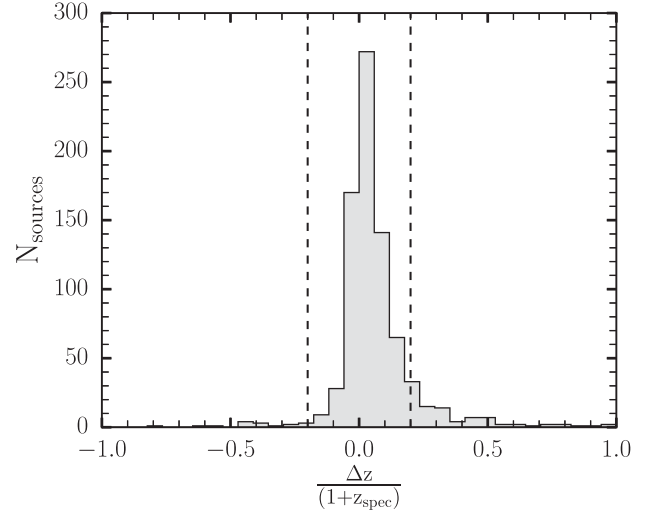
Catalogue	Size	Fraction ( per cent)
GMRT	2800	100 per cent
SERVS band 1 or 2	2369	85 per cent
SERVS band 1 and 2	2234	80 per cent
SWIRE all IRAC bands	1091	39 per cent
MIPS 24 $\mu$ m	1672	60 per cent
X-RAY	92	3.3 per cent
MRR13-PHOTZ	1456	52 per cent
MRR13-FIR-LUM	1279	46 per cent
SPECZ	817	29 per cent
REDSHIFTS	1760	63 per cent



**Figure 2.** Comparison between photometric and spectroscopic redshift for sources with both. The dashed black line corresponds to  $z_{\text{spec}} = z_{\text{phot}}$ . The top and right histograms show spectroscopic and photometric redshifts, respectively.

analyses are based on a  $\chi^2$  minimization of linear fits to each observed spectrum using multiple templates (Bolton et al. 2012). The BOSS spectroscopic redshifts were supplemented by a small number of redshifts available from the literature. For sources where a spectroscopic redshift was not available, we use photometric redshift estimates from the revised SWIRE Photometric Redshift Catalogue (Rowan-Robinson et al. 2013). The SWIRE catalogue takes into account new optical photometry in several of the SWIRE areas, and incorporates Two Micron All Sky Survey (2MASS) and UKIRT Infrared Deep Sky Survey (UKIDSS) near-infrared data. It is the most reliable photometric redshift catalogue publicly available in ELAIS N1, and covers the full GMRT mosaic.

The redshift statistics for our sample are summarized in Table 1. Spectroscopic redshifts are available for 29 per cent. The SWIRE catalogue provides photometric redshifts for 52 per cent of our sample and far-infrared luminosities for 46 per cent. Combined 63 per cent of our sample has either a spectroscopic or photometric redshift. Fig. 2 compares photometric and spectroscopic redshifts for sources with both. The histograms at the top and on the right-hand side of the figure show the distributions of photometric and spectroscopic redshifts, respectively. In general, the two redshifts agree out to spectroscopic redshift  $z_{\text{spec}} < 1$  (i.e.  $\log_{10}(1 + z) < 0.3$ ). However, a non-negligible number of outliers can be seen creating a spurious peak in the photometric redshift distribution at  $z_{\text{phot}} \sim 1$ .



**Figure 3.** Histogram showing the distribution of the  $|\Delta z| / (1 + z_{\text{spec}})$ ; the dash vertical lines indicate  $|\Delta z| / (1 + z_{\text{spec}}) = 0.2$ . The mean ( $\mu$ ) and standard deviation ( $\sigma$ ) are 0.07 and 0.20, respectively.

Fig. 3 shows the distribution of the difference  $(\Delta z)/(1 + z_{\text{spec}})$ , where  $\Delta z = z_{\text{phot}} - z_{\text{spec}}$ . The standard deviation of this distribution is  $\sigma[\Delta z/(1 + z)] \sim 0.20$ . Outliers with  $|\Delta z| / (1 + z_{\text{spec}}) > 0.2$  make up 10.40 per cent of our sample.

We also compute the normalized median absolute deviation:

$$\sigma_{\text{NMAD}} = 1.48 \times \text{median} \left( \frac{|\Delta z - \text{median}(\Delta z)|}{1 + z_{\text{spec}}} \right), \quad (1)$$

an estimate of the quality of photometric redshift that is less sensitive to outliers (Brammer, van Dokkum & Coppi 2008). We find  $\sigma_{\text{NMAD}} = 0.074$ , which is slightly higher than found in other photometric redshift catalogues (e.g. see Ilbert et al. 2009; Taylor et al. 2009; Cardamone et al. 2010).

## 5 AGN DIAGNOSTICS

Of our total sample of 2800 radio sources, 1760 have either a spectroscopic or a photometric redshift estimate. Out of these, 1526 have at least one multiwavelength (i.e. not only based on radio properties) AGN diagnostic and constitute our final sample for the purposes of source classification. In this section, we describe the combination of multiwavelength AGN diagnostics employed to obtain a census of galaxies showing evidence of hosting an AGN within this sample.

### 5.1 Radio diagnostics

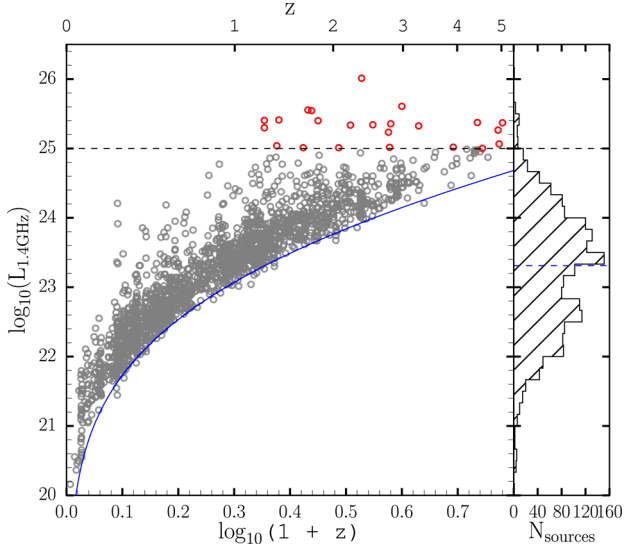
The first criteria we use to identify AGNs in our radio sample are the radio luminosities. The 612 MHz radio flux densities were converted to rest-frame 1.4 GHz effective luminosities assuming a radio spectral index of  $\alpha = -0.7$  (Ibar et al. 2010) as:

$$L_{1.4 \text{ GHz}} = 4\pi d_{\text{lum}}^2 \frac{S_{1.4 \text{ GHz}}}{(1 + z)^{1+\alpha}} \quad (2)$$

where

$$S_{1.4 \text{ GHz}} = \left( \frac{1.4}{0.61} \right)^\alpha S_{0.6 \text{ GHz}}. \quad (3)$$

We classify sources as RL AGN based on a radio luminosity cut of  $L_{1.4 \text{ GHz}} > 10^{25} \text{ W Hz}^{-1}$ , as suggested by e.g. Sajina et al. (2007); Jiang et al. (2007) and Sajina et al. (2008) and illustrated by Fig. 4.



**Figure 4.** Radio-loud AGN selection. The plot shows 1.4 GHz luminosity versus redshift for the GMRT sample with redshifts. The dashed black line shows a radio luminosity threshold of  $10^{25} \text{ W Hz}^{-1}$ . Sources above this luminosity are classified as RL AGN (red circles). The luminosity detection limit implied by the GMRT sensitivity is shown by the solid blue curve. The blue dashed line in the right-hand histogram shows the median 1.4 GHz luminosity.

We note that this is a conservative criterion, as it only selects the brightest radio-loud galaxies and quasars. Mauch & Sadler (2007) showed that the AGN radio luminosity function flattens at low luminosities, indicating that there remains a fraction of AGN powered radio sources below the cutoff. Our radio luminosity selection criterion identifies 26 RL AGN sources, constituting 1.5 per cent of the population with redshifts.

## 5.2 X-ray diagnostics

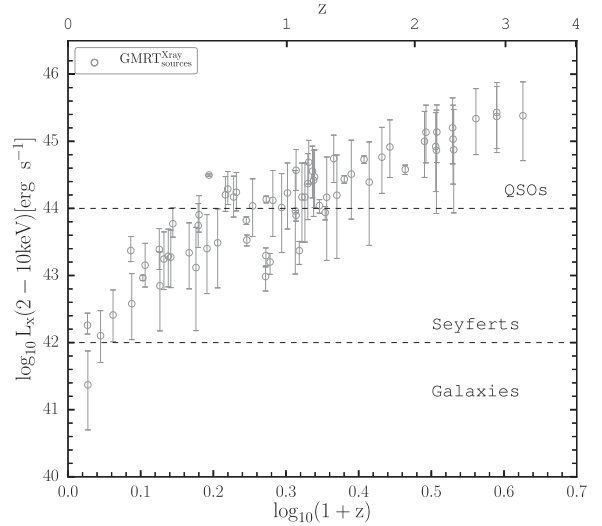
X-ray surveys are perhaps one of the most reliable methods to select AGNs, since they directly probe their high energy emission. However, dusty tori may obscure the X-ray emission and reprocess it into infrared emission. Thus, AGN detections through X-ray and infrared are largely complementary (Fadda & Rodighiero 2014). We computed the hard X-ray luminosity (2–10 keV) using the relation

$$L_x = 4\pi S_x d_L^2 (1+z)^{2-\gamma}, \quad (4)$$

where we fixed the photon-index to the commonly observed value of  $\gamma = 1.8$  (Dadina 2008; Vito et al. 2014). Fig. 5 shows the X-ray luminosity for the 70 objects having redshifts that are detected in either the X-ray deep or X-ray shallow data sets. This includes only 1 of the 26 sources classified as RL AGN in the previous section. We classify a source as an AGN based on X-ray emission when  $L_x > 10^{42} \text{ erg s}^{-1}$  following e.g. Szokoly et al. (2004). All but one source of the 70 objects lies above this threshold. We therefore classify 69 sources as hosting AGNs through this X-ray criterion, representing 4.0 per cent of our radio sample with redshifts.

## 5.3 BOSS/SDSS diagnostics

From our cross-matching, we were able to associate 779 of the GMRT sources with the BOSS spectroscopic redshifts and



**Figure 5.** X-ray luminosity as a function of redshift for the GMRT sources with X-ray detections. The dash horizontal line represents the typical demarcations for galaxies, Seyferts and QSOs.

classifications. The BOSS CLASS and SUBCLASS parameters, as detailed by Bolton et al. (2012), classify spectra as:

(1) GALAXY: identified with a galaxy template and can have the following subclasses:

- (a) STARFORMING: the spectrum has detectable emission lines that are consistent with star formation according to the criterion:  $\log_{10}(\text{O III}/\text{H}\beta) < 0.7 - 1.2(\log_{10}(\text{N II}/\text{H}\alpha) + 0.4)$ ;
- (b) STARBURST: galaxy is star forming with an equivalent width of  $\text{H}\alpha$  greater than  $50 \text{ \AA}$ ;
- (c) AGN: the spectrum has detectable emission lines that are consistent with being a Seyfert or a LINER:  $\log_{10}(\text{O III}/\text{H}\beta) > 0.7 - 1.2(\log_{10}(\text{N III}/\text{H}\alpha) + 0.4)$ ;

(2) QSO: identified with a QSO template;

(3) STAR: identified with a stellar template.

In addition, any galaxies or quasars that have lines detected at the  $10\sigma$  level with velocity dispersion  $> 200 \text{ km s}^{-1}$  at the  $5\sigma$  level have the category BROADLINE appended to their SUBCLASS.

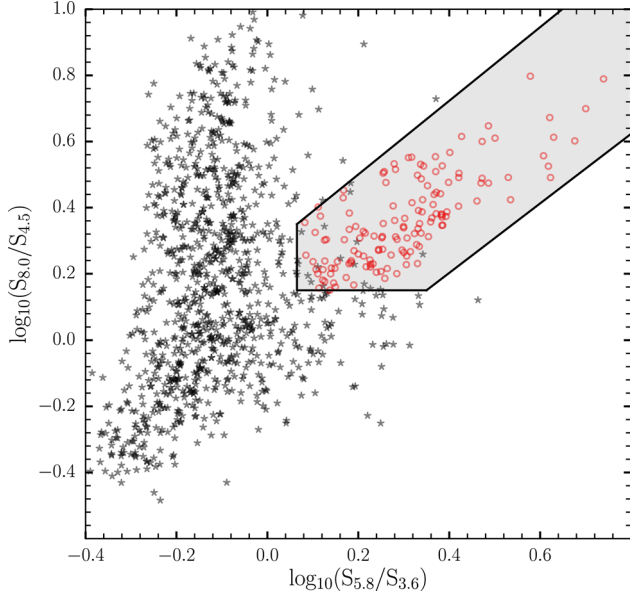
The BOSS analysis of the 779 sources yields 703 GALAXY and 73 QSO classifications. The remaining three sources were identified as STARS. Among the 703 GALAXY CLASS, 19 are classified as SUBCLASS AGN. Conversely, 172 sources are classified as STARFORMING and 141 classified as STARBURST. Four sources are classified as STARBURST BROADLINE and 43 sources classified as BROADLINE. The remaining 324 sources of the 703 GALAXY class had no SUBCLASS associations.

Of the three BOSS spectra identified as STARS, their SUBCLASS parameter indicates that they are an M4.5:111, GOVa and a cataclysmic variable star, respectively. We do not include these sources in our BOSS selection.

We classify as AGN all objects with a BOSS QSO class, as well as any source having a BOSS GALAXY class with a SUBCLASS parameter of either AGN, BROADLINE or STARBURST BROADLINE. All other GALAXY classes are taken to be SFG. Table 2 presents the breakdown of the number of the SFGs and AGNs from the BOSS spectroscopic classifications.

**Table 2.** The BOSS spectroscopic classifications results.

Category	Number	Fraction
SFG	683	39.7 per cent
AGN	96	5.5 per cent

**Figure 6.** IRAC colour-colour diagram showing the separation between AGNs (open red circles) and SFGs (black stars). The shaded region indicates the area within the Donley wedge.

### 5.4 IRAC colour diagnostics

The IRAC four-band colour-colour plane was used to identify AGNs adopting the criterion proposed by Donley et al. (2012) and defined as

$$x = \log_{10} \left( \frac{f_{5.8 \mu\text{m}}}{f_{3.6 \mu\text{m}}} \right), \quad y = \log_{10} \left( \frac{f_{8.0 \mu\text{m}}}{f_{4.5 \mu\text{m}}} \right) \quad (5)$$

$$x \geq 0.08 \wedge y \geq 0.15$$

$$\wedge y \geq (1.21 \times x) - 0.27$$

$$\wedge y \leq (1.21 \times x) + 0.27$$

$$\wedge f_{4.5 \mu\text{m}} > f_{3.6 \mu\text{m}} > f_{4.5 \mu\text{m}} \wedge f_{8.0 \mu\text{m}} > f_{5.8 \mu\text{m}} \quad (6)$$

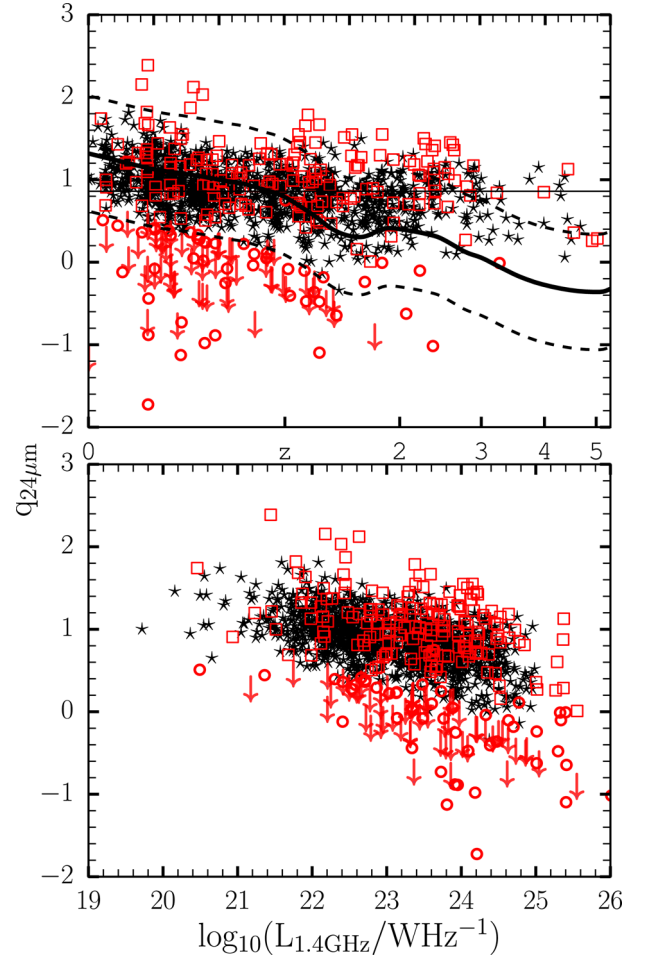
This criterion has been designed to reject the majority of low- and high-redshift star-forming contaminants in the Lacy et al. (2004, 2007) and Stern et al. (2005) AGN selection wedges. Fig. 6 presents IRAC colour-colour diagram for our 1091 GMRT sources with four IRAC band detections. We select 138 sources from this criterion. Of these, 123 sources have redshift estimates, constituting 7.0 per cent of the radio sources with redshift.

### 5.5 Mid-infrared – radio flux ratio

The MIPS (Rieke et al. 2004) 24  $\mu\text{m}$  flux density and the effective 1.4 GHz flux density,  $S_{1.4 \text{ GHz}}$  (equation 3), were used to calculate the  $q_{24 \mu\text{m}}$  parameter,

$$q_{24 \mu\text{m}} = \log_{10}(S_{24 \mu\text{m}}/S_{1.4 \text{ GHz}}). \quad (7)$$

We compute  $q_{24 \mu\text{m}}$  for the radio sources with MIPS 24  $\mu\text{m}$  detections and redshifts and compare it to the redshifted  $q_{24 \mu\text{m}}$  value for

**Figure 7.** Top:  $q_{24 \mu\text{m}}$ , the logarithm of the ratio between the mid-infrared and radio flux for the GMRT sources with redshift estimates. The solid black curve shows the predicted value of M82 template, the dividing line between RQ and radio-loud AGNs with  $\pm 2\sigma$  dispersion (dash black curve). The horizontal line is the median value of  $q_{24 \mu\text{m}}$  for the sources. The black stars, open red squares and open red circles SFGs, RQ AGN and RL AGN, respectively. The downward pointing arrows represent RL AGN with upper limits (see equation 9). Bottom:  $q_{24 \mu\text{m}}$  versus 1.4 GHz luminosity for SFGs, RQ AGNs and RL AGN.

the M82 local standard starburst galaxy template as done by Bonzini et al. (2013) to identify SFGs and radio-loud AGNs. We normalize the M82 SED to the local average value of  $q_{24 \mu\text{m}}$  obtained by Sargent et al. (2010) and define the SFG locus as the region within  $\pm 2\sigma$  of the normalized M82 template in the  $(q_{24 \mu\text{m}}, z)$  plane, where  $\sigma$  is the 0.35 average spread for local sources by Sargent et al. (2010). Sources below this locus display a radio excess with respect to SFGs and are therefore classified as radio-loud AGNs.

The results for our sources are illustrated in the top panel of Fig. 7. The black stars, and open red squares above the  $-2\sigma$  dispersion curve (dash black curve) represents the SFGs and RQ AGN, respectively. This criterion initially selects 42 radio sources as RL AGN (open red circles in Fig. 7) constituting  $\sim 2.4$  per cent of the radio population with redshifts. We compare this method to the radio-loud AGN classification based on radio luminosity in Section 5.1. Of the 26 sources selected as radio-loud AGNs according to their radio luminosity 15 have mid-infrared detections. Amongst these, only five are also classified as radio-loud using the  $q_{24 \mu\text{m}}$  selection

criterion. For the sources with a redshift detection but no MIPS counterpart, we assumed that

$$S_{24\mu\text{m}} < S_{24\mu\text{m lim}} = 286.6 \mu\text{Jy} \quad (8)$$

and thus the upper limit (downward pointing arrow symbols in Fig. 7) is given by

$$q_{24\mu\text{m lim}} = \log_{10}(S_{24\mu\text{m lim}}/S_{1.4\text{GHz}}) \quad (9)$$

For our sources with redshifts within the same range studied by Sargent et al. (2010), i.e.  $z \sim 1.4$ , we measure a median  $q_{24\mu\text{m}}$  value of  $1.10 \pm 0.02$ , whereas for our full sample with redshifts we measure a median  $q_{24\mu\text{m}} = 0.86 \pm 0.01$  at a median redshift of  $\sim 0.71$ . We estimated the median and the error on the median using the median absolute deviation estimator as this is a more robust measure of the variability of a univariate sample of quantitative data than the standard deviation (Rousseeuw & Croux 1993). Our result is in agreement with and more precise than previous work from Appleton et al. (2004) who estimated  $q_{24\mu\text{m}} = 0.84 \pm 0.28$  by matching over 500 *Spitzer* sources at  $24\mu\text{m}$  with VLA 1.4 GHz  $\mu\text{Jy}$  radio sources for the *Spitzer* First Look Survey (FLS) extending to  $z > 2$ . Huynh et al. (2010) measured a median  $q_{24\mu\text{m}} = 0.71 \pm 0.31$  for 84 sources with detections in both the IR and radio for observations of the Hubble Deep Field South taken with the *Spitzer Space Telescope* up to  $z > 1$ .

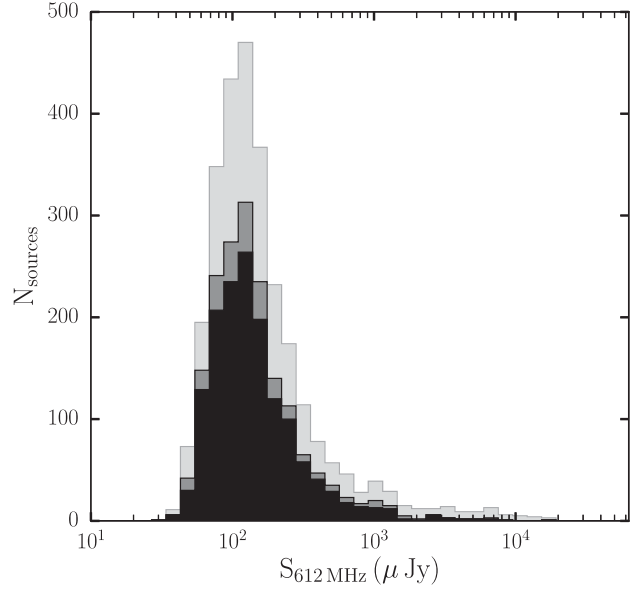
## 5.6 AGN/SFG classification overview

We have carried out a multiwavelength study using optical, X-ray, infrared and radio data to search for evidence of the presence of an AGN in our sample of 1526 radio sources using five criteria.

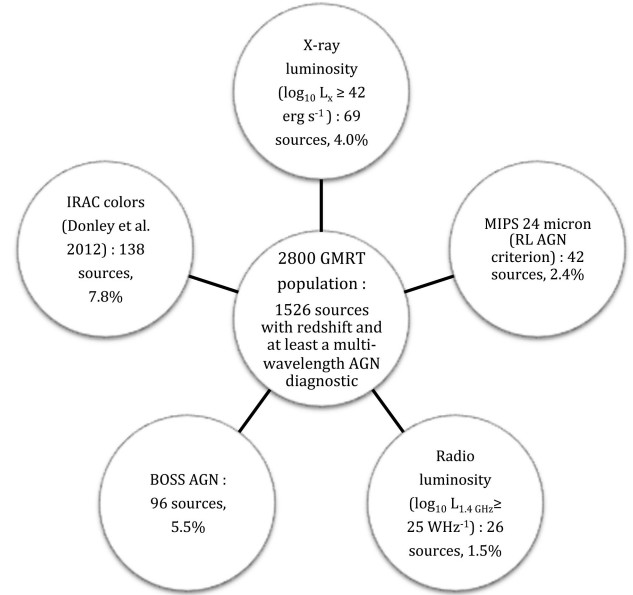
- (i) Radio power,  $L_{1.4\text{GHz}} \geq 10^{25} \text{ W Hz}^{-1}$ .
- (ii) X-ray luminosity,  $L_x \geq 10^{42} \text{ erg s}^{-1}$ .
- (iii) BOSS AGN spectroscopic classification.
- (iv) IRAC colours using the Donley et al. (2012) criteria.
- (v) Mid-infrared to radio flux ratio using the Bonzini et al. (2013) criterion.

The 612-MHz flux density distribution of the sample is shown in Fig. 8. The entire range of flux densities in the total GMRT population is sampled. The minimum flux density for the 1526 sources with AGN diagnostics is  $52 \mu\text{Jy}$  and the median flux density is  $123.3 \mu\text{Jy}$ , close to the median of  $128.8 \mu\text{Jy}$  for the total sample.

Combining all the indicators we identify sources that exhibit evidence of the presence of an AGN. The breakdown of classification from each indicator is illustrated in Fig. 9, and Table 3 provides a matrix showing the correlation of classification among the different indicators. The most successful indicators, in terms of the number of objects identified as AGN, are the IRAC colours and BOSS spectral classification. We note that only one source from the radio power AGN criterion out of a total of 26 sources, has an X-ray luminosity greater than  $10^{42} \text{ erg s}^{-1}$ . Also, two of these sources are confirmed



**Figure 8.** The distribution of 612-MHz flux densities for the entire GMRT sample of 2800 sources (light grey), radio sources with redshifts (dark grey) and sources with redshifts that also have at least one diagnostic for AGN activity (black).



**Figure 9.** A schematic of the various AGN selection.

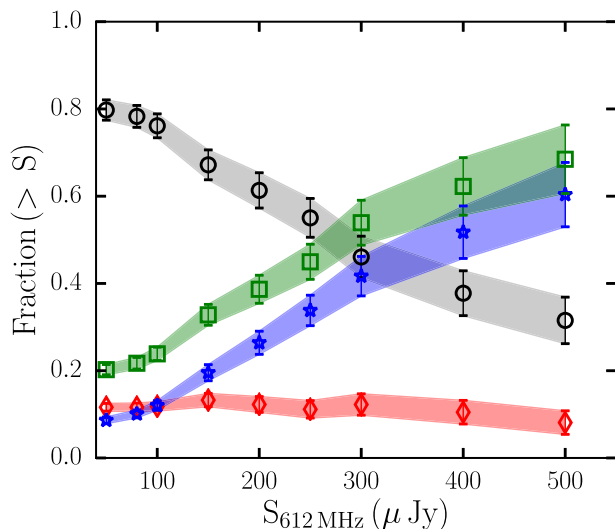
**Table 3.** Number of sources identified as AGN by each of the diagnostics. Entries indicate the number of AGN that are common to both indicators.

Indicator	Radio luminosity	X-ray	BOSS AGN	IRAC colours	MIPS 24
Radio luminosity	26	—	—	—	—
X-ray	1	69	—	—	—
BOSS AGN	2	26	96	—	—
IRAC colours	6	35	45	138	—
MIPS 24	5	5	5	2	42



**Table 4.** Total number of SFGs, RQ AGNs and RL AGN from a combination of the selection criteria for sources with redshift.

Class	Number	Fraction (per cent)
SFG	1226	80.3 per cent
RQ AGN	173	11.4 per cent
RL AGN	127	8.3 per cent



**Figure 10.** The relative fraction of AGN and SFG as a function of minimum flux density. The data points show the fraction of the sample greater than flux density,  $S_{612\text{ MHz}}$ , that are classified as RQ AGN (red diamonds), RL AGN (blue stars), all AGN (green squares) and SFG (black circles).

as AGNs by the BOSS criterion, whereas six of them are identified by the IRAC criterion. The disagreement between the radio luminosity and the X-ray luminosity criterion may be attributed to heavily obscured sources in the X-rays, since radio observations are almost unaffected by dust extinction and therefore can detect even the most obscured systems (Del Moro et al. 2013).

We further classify the AGNs as RL AGN for all the sources with either  $L_{1.4\text{ GHz}} > 10^{25}\text{ W Hz}^{-1}$  (see Section 5.1) or  $q_{24\text{ }\mu\text{m}}$  below the M82 locus (see Section 5.5). Above this threshold, a source is classified as an RQ AGN if it shows clear evidence of an AGN in the X-ray, in the BOSS/SDSS AGN spectroscopic classification, from its radio power or from its IRAC colours satisfying the Donley criterion. Table 4 presents the total number of AGNs and SFGs from a combination of the selection criteria for sources with redshifts. The objects classified as SFG are those sources in our redshift sample that do not show evidence of AGN activity in any of the diagnostics. This may be considered an upper limit to the population of sources in this flux density regime whose radio emission is powered by star formation processes. The large number of objects in our sample allows us to examine the change in population with flux density. Fig. 10 shows the fraction of objects in each class in our sample as a function of limiting flux density. For a given flux density,  $S_{612\text{ MHz}}$ , the plot shows the fraction of objects that are classified as SFG, RL AGN and RQ AGN in the sample of objects above that flux density. The green points shows the fraction for the total AGN population. The curves highlight the dramatic change in population over this flux density range. The SFG fraction exhibits a monotonic increase with decreasing flux density from  $\sim 30$  per cent to 80 per cent. RL AGN decrease rapidly from being the dominant

population above  $\sim 400\text{ }\mu\text{Jy}$  to the smallest fraction below  $\sim 100\text{ }\mu\text{Jy}$ . The fraction of RQ AGN remains roughly constant with flux density at  $\sim 10$  per cent.

Bonzini et al. (2013) found that  $\sim 60$  per cent of the 883 radio sources above  $\sim 50\text{ }\mu\text{Jy}$  from a VLA image at 1.4 GHz on  $\sim 0.3\text{ deg}^2$  of the ECDFs to be SFGs,  $\sim 26$  per cent to be RQ AGNs and  $\sim 14$  per cent to be RL AGN. Rawlings et al. (2015) separated the same 1.4 GHz extragalactic radio source population as Bonzini et al. (2013) into AGN and SFGs by fitting IR SEDs constructed using IRAC, MIPS and SPIRE photometry. Overall, they found that for 40 per cent of their sample the radio emission is powered by star formation, while for 20 per cent of their sample the radio emission is powered by an AGN and the remaining 40 per cent of their sample is made up by hybrids (i.e. no sign of jet activity, not clear whether or not the radio emission is powered by AGN).

Using a smaller but deeper 1.4 GHz sample reaching a  $32.5\text{ }\mu\text{Jy}$  flux limit over  $0.29\text{ deg}^2$  of the ECDFS VLA image, Padovani et al. (2015) identified 626 radio sources with redshifts and classified 55 per cent, 25 per cent and 20 per cent as SFGs, RQ AGNs and RL AGN, respectively. Vernstrom et al. (2016) classified 10 per cent RL AGN, 28 per cent RQ AGN and 68 per cent SFGs from 558 sources at 3 GHz in the Lockman Hole North from a single pointing with the JVLA.

For a spectral index of  $-0.7$ , the equivalent 1.4 GHz flux density threshold of our radio selected sample is  $29\text{ }\mu\text{Jy}$ , significantly deeper than the Bonzini et al. (2013) study, and slightly deeper than Padovani et al. The increased depth combined with our larger survey area provides a source sample that is 70 per cent larger than the Bonzini study and over twice the size of the Padovani sample. In comparison to Bonzini et al., our results indicate that the fraction of radio sources attributed to SFGs continues to increase rapidly with decreasing flux density, from  $\sim 60$  per cent to 80 per cent. We also confirm that RQ AGN dominate over RL AGN, with 40 per cent more RQ objects compared to RL objects in our sample.

We find a much higher fraction of SFG compared to the analysis of Padovani et al., which found instead approximately equal fractions of SFG and AGN. This difference may be partially explained by the lower frequency of the GMRT sample, which selects against faint inverted spectrum sources, such as associated with compact AGN cores, which may be present in the VLA sample near the 1.4 GHz flux threshold. Future studies of the spectral index distribution of  $\mu\text{Jy}$  radio sources will be important to resolve this difference.

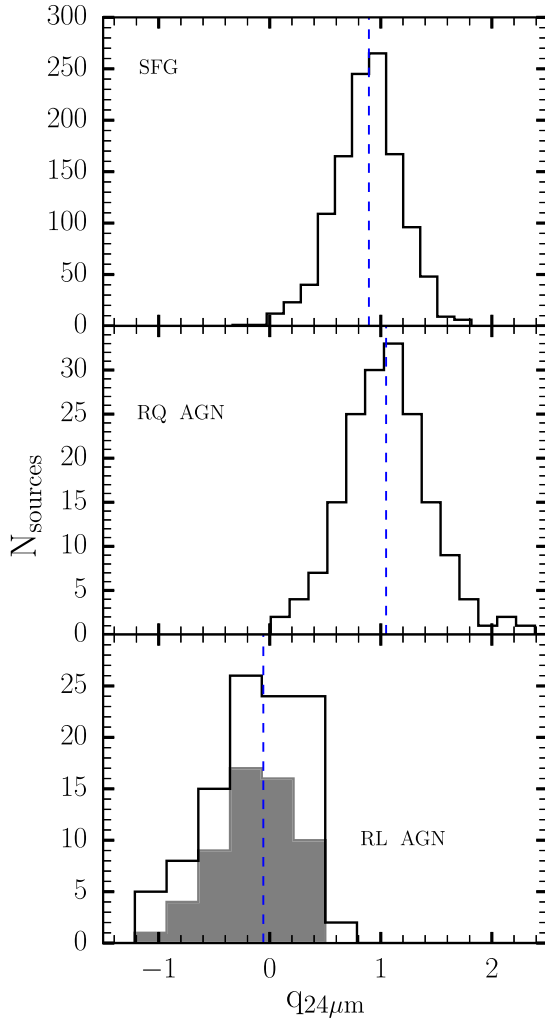
## 6 DISCUSSION

### 6.1 Properties of the classified sources

The bottom panel of Fig. 7 plots  $q_{24\text{ }\mu\text{m}}$  as a function of 1.4 GHz luminosity for SFGs (black stars), RQ AGNs (open red squares) and RL AGN (open red circles). The  $q_{24\text{ }\mu\text{m}}$  parameter seems to show a decreasing trend with increasing radio luminosity, and this is clearly evident for RL AGN. In Fig. 11, we show the distribution of  $q_{24\text{ }\mu\text{m}}$  for SFGs (top panel), RQ AGNs (middle panel) and RL AGN (bottom panel). The median  $q_{24\text{ }\mu\text{m}}$  value for SFGs is  $0.89 \pm 0.01$  with a distribution that is peaked at the median with an RMS scatter of 0.18. The median  $q_{24\text{ }\mu\text{m}}$  for RQ AGN is larger than for SFG at  $1.05 \pm 0.03$ , but like SFG is also peaked at the median with a slightly larger RMS of 0.24. RL AGN, on the other hand, have much lower median  $q_{24\text{ }\mu\text{m}}$  of  $-0.06 \pm 0.07$ , and a broader, less peaked distribution with a larger RMS scatter of 0.34.

Far-Infrared luminosities,  $L_{\text{IR}}$ , were derived from the integrated (8–1000  $\mu\text{m}$ , rest frame) far-infrared luminosities estimated by





**Figure 11.** Distribution of the  $q_{24\mu m}$ -parameter for our selected SFG (top panel), RQ AGN (middle panel) and RL AGN (bottom panel). The shaded histogram in the bottom panel shows the  $q_{24\mu m}$  distribution for the RL AGN selected from the upper limits given in equation (9). The dash vertical line in each panel designates the median value of the entire distribution, also listed in each panel.

Rowan-Robinson et al. (2013) (hereafter [RR13](#)) using SWIRE photometry. We corrected the [RR13](#) values to our more accurate spectroscopic redshift by

$$L_{\text{IR}} = \frac{d_L^2}{d_{L,\text{RR13}}^2} L_{\text{IR,RR13}}. \quad (10)$$

Here,  $d_L^2$  is the luminosity distance calculated using our redshift and  $d_{L,\text{RR13}}^2$  is the luminosity distance using the [RR13](#) redshifts.

The distributions of redshift,  $L_{1.4\text{GHz}}$  and FIR luminosities for the three populations are presented in Fig. 12. The redshift distributions are shown in the left vertical panels. Photometric (open) and spectroscopic (filled) redshift distributions are shown separately and grey shaded area indicates  $z > 3$ . We detect objects of all three types over the full redshift range up to  $z > 3$ . The median redshift for each is  $\sim 1$ . Precise values are listed in Table 5.

The middle vertical panels of Fig. 12 show the radio power distribution for the three class of sources. As for  $q_{24\mu m}$ , SFG and RQ AGN show peaked distributions while the RL AGN have a wider distribution without a clear maximum. The distributions also

show a consistent increase in the median radio power from SFG to RQ AGN to RL AGN. As shown in Table 5, the increase in the median is  $\Delta(\log L_{1.4\text{GHz}}) = 0.30 \pm 0.7$  between SFG and RQ AGN and  $\Delta(\log L_{1.4\text{GHz}}) = 0.38 \pm 0.15$  between RQ and RL AGN.

As shown in the right-hand panel of Fig. 12 and Table 5, the median  $L_{\text{IR}}$  and the width of the distributions increase from SFG, to RQ AGN and RL AGN. Fig. 12 indicates the  $L_{\text{IR}}$  ranges corresponding to NIRGs, LIRGs, ULIRGs and HyLIRGs (see Patel et al. 2013), and Table 6 shows the breakdown of the number of sources within each range for each class. The majority of the SFGs have  $L_{\text{IR}}$  in the range of LIRGs and ULIRGs. RQ AGNs are evenly distributed over LIRGs, ULIRGs and HyLIRGs, with very few in the NIRGs range. RL AGN are more broadly distributed with the dominant faction at the low  $L_{\text{IR}}$  range.

## 6.2 The far-infrared radio correlation

We characterized the IR/radio properties of our sources by the logarithmic ratio between the IR bolometric (8–1000  $\mu\text{m}$ ) luminosity and the radio 1.4 GHz luminosity  $q_{\text{IR}}$  (Helou, Soifer & Rowan-Robinson 1985):

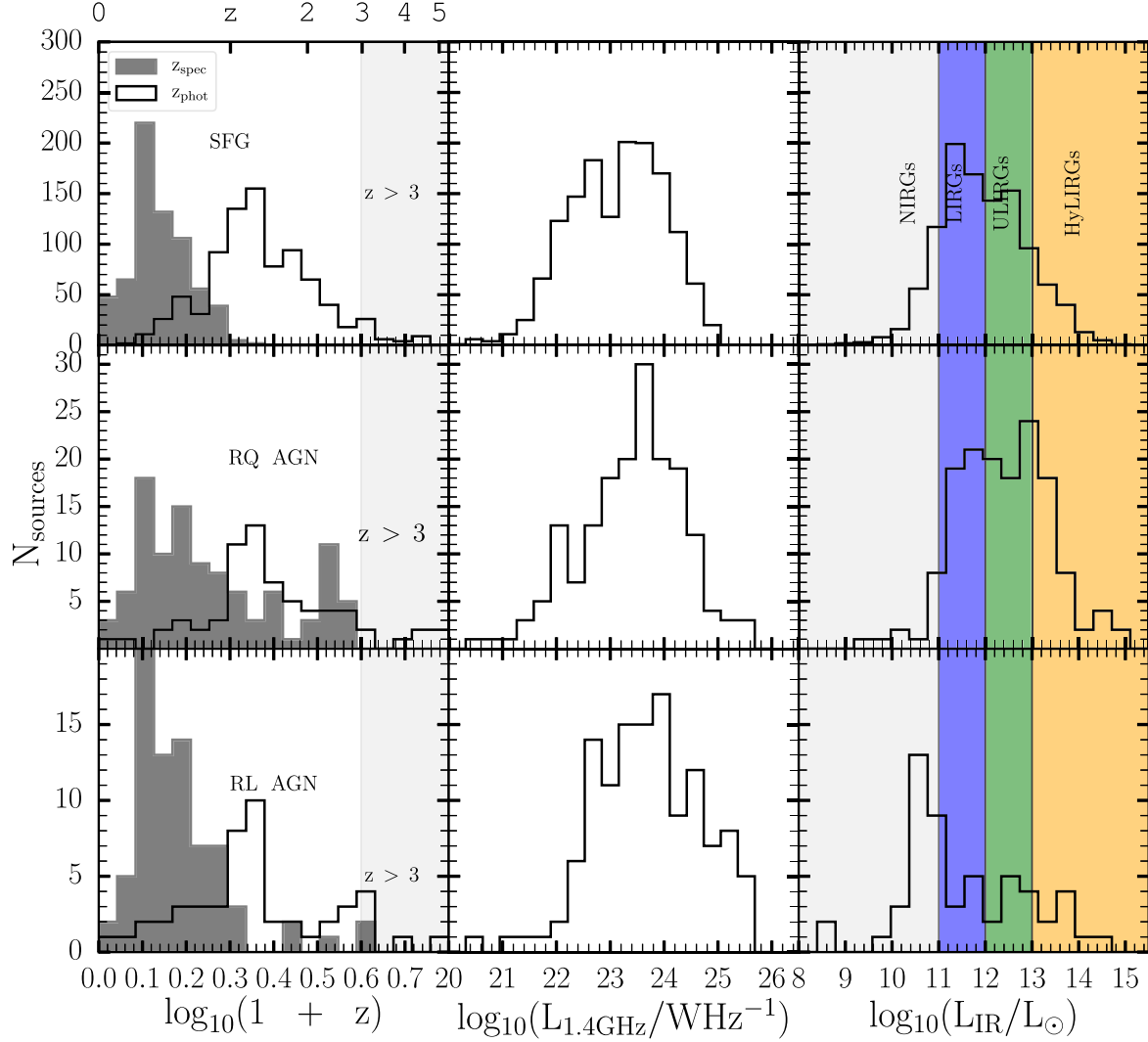
$$q_{\text{IR}} = \log_{10} \left( \frac{L_{\text{IR}}}{3.75 \times 10^{12} \text{ W}} \right) - \log_{10} \left( \frac{L_{1.4\text{GHz}}}{\text{W Hz}^{-1}} \right) \quad (11)$$

Fig. 13 presents radio power at 1.4 GHz versus FIR luminosity for SFGs detected by our classification. The contours represent the  $1\sigma$ ,  $2\sigma$  and  $3\sigma$  of the GMRT sources with radio and IR luminosity. The diagonal solid line in each panel shows the  $q_{\text{IR}}$  relation given in equation (11) for the SFGs since the FIRC is believed to be driven mostly by star formation (Condon 1992; Yun, Reddy & Condon 2001). The dotted lines in all the panels indicate the  $\pm 1\sigma$  dispersion in the value of the calculated  $q_{\text{IR}}$ . The SFGs have a tight FIRC, with a median  $q_{\text{IR}}$  value of  $2.45 \pm 0.01$ . The selected RQ AGNs also show a tight correlation in agreement with the FIRC, with a median  $q_{\text{IR}}$  value of  $2.47 \pm 0.04$ . RL AGNs lie well above the FIRC for SFGs and RQ AGNs with a median  $q_{\text{IR}}$  value of  $1.43 \pm 0.07$ . This difference for RL AGN can be attributed to the additional AGN component to radio emission (Rawlings et al. 2015).

Our median  $q_{\text{IR}} = 2.45 \pm 0.01$  for SFG is in good agreement with a measurement, e.g. Ivison et al. (2010), who used submillimetre galaxy (SMG) samples with radio emission to measure a median  $q_{\text{IR}} = 2.40 \pm 0.2$  for a sample of IR-bright ( $S_{250\mu m} \gtrsim 20$  mJy) galaxies out to  $z < 3.5$ . Our median  $q_{\text{IR}}$  is higher, however, than the value of  $q_{\text{IR}} = 2.17 \pm 0.1$ , as measured by Magnelli et al. (2010) for a sample of bright ( $S_{850\mu m} > 5$  mJy) single-dish submillimetre sources observed in GOODS-N, and lower than that reported by Thomson et al. (2014), who measured a median  $q_{\text{IR}} = 2.56 \pm 0.05$  for 870  $\mu\text{m}$ -selected submillimetre galaxies, observed at high resolution with ALMA in the Extended Chandra Deep Field South. Our measurement of  $q_{\text{IR}}$  is also lower than that reported by Bell (2003) who measured  $q_{\text{IR}} = 2.64 \pm 0.02$  for 162 galaxies with IR and radio data and no signs of AGN by assembling a sample of SFGs with FUV, IR and radio data to quantitatively explore the radio-IR correlation. Our value of  $q_{\text{IR}}$  from a larger low-frequency selected sample lies thus within the range of variation of values derived from submillimetre-selected samples.

## 6.3 Radio emission in SFGs and RQ AGNs

Miller, Rawlings & Saunders (1993) suggested that RQ AGNs are a scaled-down version of RL AGN at lower radio power, while Sopp & Alexander (1991) found that the major contribution to



**Figure 12.** Distribution of SFG (top panels), RQ AGN (middle panels) and RL AGN (bottom panels) for their redshifts,  $L_{1.4\text{ GHz}}$  and FIR luminosities, respectively. The left vertical panels represent the distributions for spectroscopic (filled) and photometric (open) redshifts for the various class of sources. The grey shaded areas show  $z > 3$ . The middle vertical panels represent the radio power distributions. The limits of NIRGs, LIRGs, ULIRGs and HyLIRGs (Patel et al. 2013) are shown as grey, blue, green and orange shaded areas, respectively, in the right vertical panels to represent the range of sources based on their FIR luminosity.

**Table 5.** Median values of redshift ( $z$ ),  $L_{1.4\text{ GHz}}$ ,  $L_{\text{IR}}/L_{\odot}$  and  $\langle q_{24\text{ }\mu\text{m}} \rangle$  for the different class of sources.

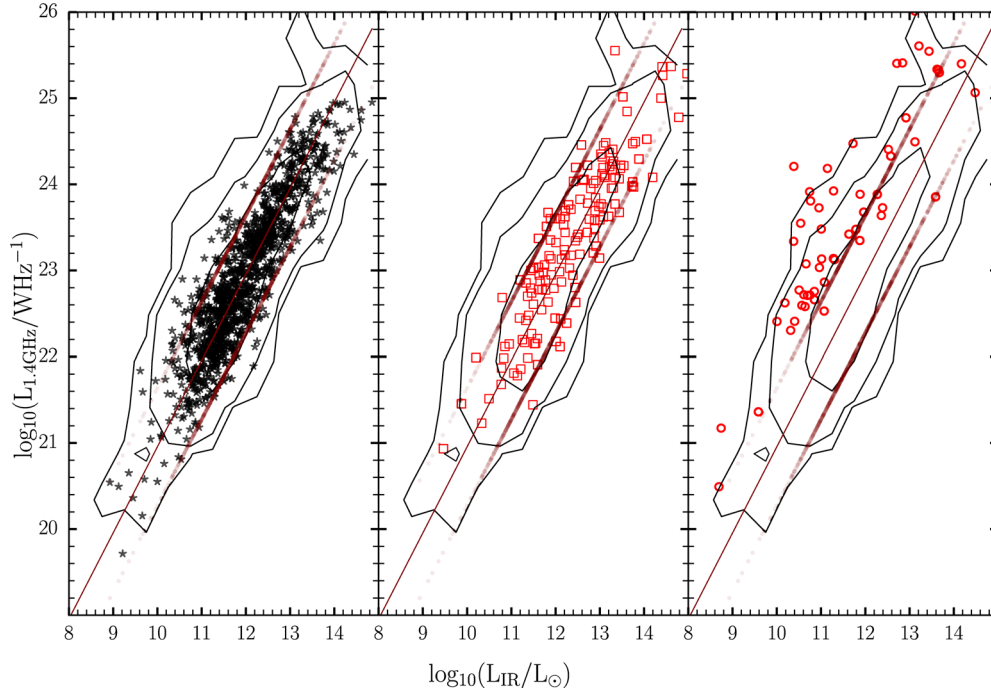
Class	$\langle z \rangle$	$\langle \log_{10}(L_{1.4\text{ GHz}}) \rangle$	$\langle \log_{10}(L_{\text{IR}}/L_{\odot}) \rangle$	$\langle q_{24\text{ }\mu\text{m}} \rangle$
SFG	$0.81 \pm 0.01$	$23.24 \pm 0.02$	$12.44 \pm 0.04$	$0.89 \pm 0.01$
RQ AGN	$1.09 \pm 0.07$	$23.54 \pm 0.07$	$12.61 \pm 0.09$	$1.05 \pm 0.03$
RL AGN	$0.88 \pm 0.08$	$23.92 \pm 0.13$	$13.02 \pm 0.39$	$-0.06 \pm 0.07$

**Table 6.** Number of NIRGs, LIRGs, ULIRGs and HyLIRGs in the subsample according to their star-forming, RQ and radio-loud FIR luminosities.

$\log_{10}(L_{\text{IR}}/L_{\odot})$ range	Type	SFG#	RQ AGN#	RL AGN#
$\leq 11$	NIRG	149	11	23
11–12	LIRG	439	45	14
12–13	ULIRG	339	48	8
$\geq 13$	HyLIRG	155	45	10

the radio emission in these systems is due to the star formation in the host galaxy. However, the study of the cosmological evolution and luminosity function by Padovani et al. (2011) found that their radio emissions are significantly different for the two types of AGNs, while they are indistinguishable for SFGs and RQ AGNs. We characterize nature of the radio emission from the three types by comparing the star formation rates inferred from the IR and radio. The empirical conversion between the radio power at 1.4 GHz and the SFR of the galaxy according to Murphy et al. 2011 is

$$\text{SFR}_{\text{radio}}[\text{M}_{\odot} \text{ yr}^{-1}] = \log_{10}(L_{1.4\text{ GHz}}) - 21.20 \quad (12)$$



**Figure 13.**  $\log_{10}(L_{1.4\text{GHz}})$  versus  $\log_{10}(L_{\text{IR}}/L_{\odot})$  for SFG (first panel), RQ AGN (middle panel) and RL AGN (last panel) according to the AGN selection described in Section 5.6. The contours show  $1\sigma$ ,  $2\sigma$  and  $3\sigma$  confidence intervals of the GMRT sources with radio and IR luminosity, respectively. The diagonal solid line in each panel shows the  $q_{\text{IR}}$  relation given in equation (11) for the SFGs.

In Fig. 14, we compare the SFR computed from the FIR luminosities by RR13 with the SFR derived from the radio luminosities for our classified SFGs and RQ AGN. A regression fit to the data yields

$$\log_{10}(\text{SFR}_{\text{FIR}}) = 0.95 \pm 0.02 \times \log_{10}(\text{SFR}_{\text{radio}}) - 0.02 \pm 0.03 \quad (13)$$

for all the sources with redshifts having infrared and radio luminosities, while for SFG alone we obtain

$$\log_{10}(\text{SFR}_{\text{FIR}})_{\text{SFG}} = 0.98 \pm 0.02 \times \log_{10}(\text{SFR}_{\text{radio}})_{\text{SFG}} - 0.07 \pm 0.03 \quad (14)$$

and for RQ AGN

$$\log_{10}(\text{SFR}_{\text{FIR}})_{\text{RQ AGN}} = 1.04 \pm 0.05 \times \log_{10}(\text{SFR}_{\text{radio}})_{\text{RQ AGN}} - 0.12 \pm 0.11 \quad (15)$$

The fits for the SFGs and RQ AGNs (shown as black and red lines, respectively, in Fig. 14) are not significantly different within errors, suggesting that the main contribution to the radio emission in RQ AGN is due to the star formation in the host galaxy rather than black hole activity. Thus radio power is a good tracer for the SFR also in RQ AGNs.

#### 6.4 SFGs at high redshift

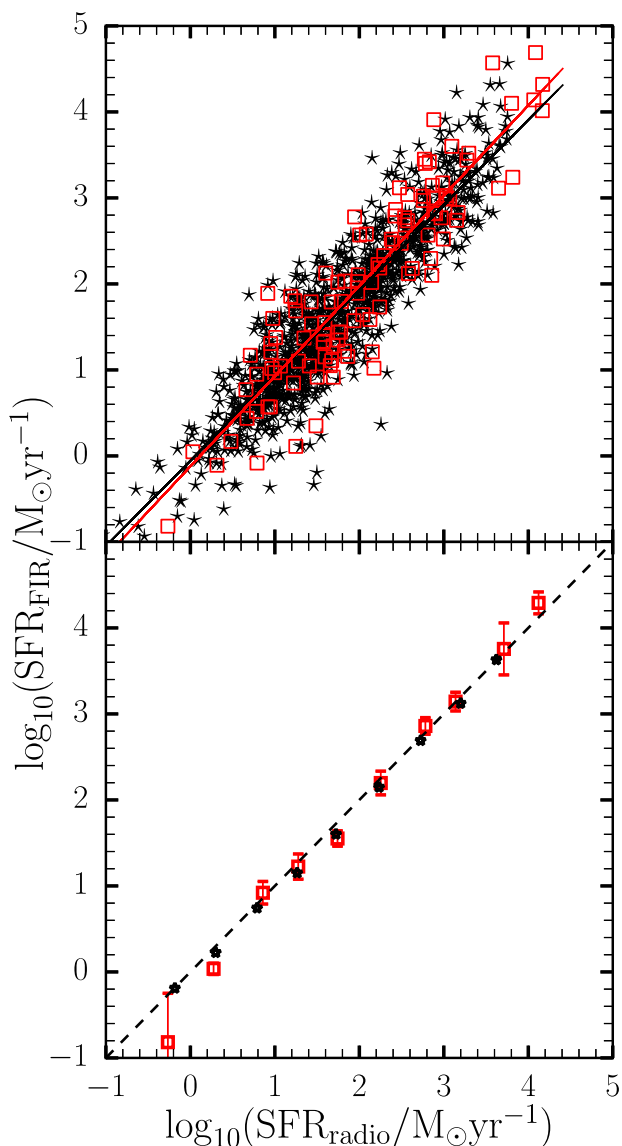
The SFGs in our radio sample, while predominantly at  $z < 2$ , include some objects with photometric redshifts much larger, including 27 sources with  $z \geq 3$ . We investigate the reliability of such high redshifts by following the analysis of Wang, Barger & Cowie (2012), who presented a new colour selection of extremely red objects (EROs) (i.e. most extreme dust-hidden high-redshift galaxies) with  $K_s$  and IRAC colours of  $K_s - 4.5 \mu\text{m} > 1.6$ . The photometric redshifts used by Wang et al. (2012) to select EROs are between 1.5 and 5, with  $\sim 70$  per cent at  $z \sim 2-4$ . This selection aims at galaxies at  $z > 2$  whose extremely red colours are likely caused by

large dust extinction. We use their approach to examine our SFGs sample and in particular where our objects at  $z > 3$  reside in the diagnostic plot. Fig. 15 presents the  $K_s$ , 3.6 and 4.5 colour-colour diagram for our selected SFGs colour coded according to redshift (top panel) and, also the same sample with the same redshift demarcations used by Wang et al. (2012). The top panel shows that SFGs at high redshifts have  $2.5 \log_{10}(S_{4.5}/S_{K_s}) > 0$ , consistent with this high-redshift selection criterion.

## 7 CONCLUSION

This work was aimed at disentangling the different radio populations that contribute to the faint radio sky. We have explored different AGN indicators from the radio, mid-infrared, optical and X-ray. We reaffirm that the ratio between the mid-infrared and radio flux parametrized by the  $q_{24 \mu\text{m}}$  value, demonstrated in Bonzini et al. (2013), is an important parameter to identify RL AGN. Our scheme expands on the one adopted by Bonzini et al. (2013) and combines radio, mid-infrared, optical and X-ray data to efficiently separate the radio source population with redshift associations into three classes: SFGs, RQ AGNs and RL AGN.

We have determined the relative contribution of the three classes of sources to the subsample of 1526 radio sources with redshifts and at least one multiwavelength diagnostic and find that  $\sim 80$  per cent are SFGs,  $\sim 12$  per cent are RQ AGNs and  $\sim 8$  per cent are RL AGN. Compared to previous analysis of sources over smaller areas at 1.4 GHz in the ECDFS, our result indicates a continued increase in the relative fraction of SFG with decreasing flux density, and confirms that RQ objects dominate the AGN population. The significantly higher fraction of SFG in our sample may also partially arise from the selection at lower frequency, where at a given flux density threshold flat-spectrum AGN cores are preferentially detected at 1.4 GHz. Multifrequency investigations to explore the

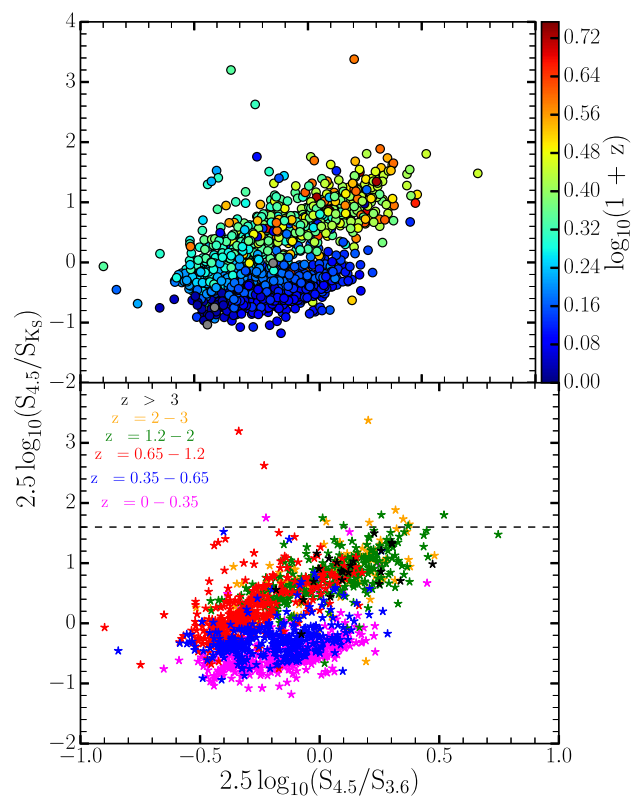


**Figure 14.** SFR derived from the FIR luminosity versus the SFR from the radio luminosity. SFGs are plotted as black stars and RQ AGNs as open red squares. The bottom panel show the binned  $\log_{10}(\text{SFR})$  for the SFGs and the RQ AGNs in bin width of  $0.5 \log_{10}(\text{SFR})$ .

spectral index distribution of  $\mu\text{Jy}$  radio sources will help resolve this question.

The median redshift of our radio sources for all three categories is  $\sim 1$ , although in all cases detections span the entire range up to  $z > 3$ . The median values of both the radio and infrared luminosity systematically increase from SFG, to RQ AGN and RL AGN (see Table 5).

The median  $q_{24\mu\text{m}}$  for SFG,  $0.89 \pm 0.01$ , is slightly below that for RQ AGN,  $1.05 \pm 0.03$ , but both differ substantially from the value for RL AGN of  $-0.06 \pm 0.07$ . In contrast to  $q_{24\mu\text{m}}$ , SFG and RQ AGN show no difference in the ratio of radio to bolometric IR luminosity, with  $q_{\text{IR}}$  of  $2.45 \pm 0.01$  and  $2.47 \pm 0.04$ , respectively. The far-IR Radio correlation ( $q_{\text{IR}}$ ) seen in the SFGs is in good agreement with the value found locally (Yun & Carilli 2002) and at higher redshift (Ivison et al. 2010; Seymour et al. 2011). Although the median radio luminosity of the RQ AGN population is slightly higher than the SFGs, there is no distinction between the objects in



**Figure 15.**  $K_s$ , 3.6 and 4.5 colour-colour diagram. Top panel: SFGs colour coded with redshift. Bottom panel: SFG sources with same redshift demarcation ranges following (Wang et al. 2012).

far-IR radio correlation, suggesting that the radio emission from RQ AGN host galaxies results primarily from star formation activity. The RL AGN on the other hand are systematically above the far-IR correlation for SFG and RQ AGN, with a median  $q_{\text{IR}}$  of  $1.54 \pm 0.06$ , indicating the presence of additional AGN-powered radio emission.

The need to better understand the faint radio source population in the high-redshift universe is one of the key motivations for the construction of the next generation of very large radio telescopes such as the SKA. In this study, we presented a multiwavelength analysis to classify the  $\mu\text{Jy}$  population. It is clear that SFG will form a high and growing fraction of the radio sources as we probe deeper. Next-generation surveys will thus probe beyond the AGN phenomenon to the underlying radio astrophysics of the evolution of galaxies and star formation. The GMRT data presented here in total intensity also include full-Stokes polarimetry. An exploration of the polarization properties of this faint radio source population will be the subject of a subsequent paper.

## ACKNOWLEDGEMENTS

The authors acknowledge support from the Square Kilometre Array South Africa project, the South African National Research Foundation and Department of Science and Technology. EFO acknowledges funding from the National Astrophysics and Space Science Programme. MV acknowledges support from the European Commission Research Executive Agency (FP7-SPACE-2013-1 GA 607254), the South African Department of Science and Technology (DST/CON 0134/2014) and the Italian Ministry for Foreign Affairs and International Cooperation (PGR GA ZA14GR02).



We thank the staff of the GMRT that made these observations possible. GMRT is run by the National Centre for Radio Astrophysics of the Tata Institute of Fundamental Research.

This work is based in part on observations made with the *Spitzer Space Telescope*, which is operated by the Jet Propulsion Laboratory, California Institute of Technology under a contract with NASA.

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