

# Limits on long-time-scale radio transients at 150 MHz using the TGSS ADR1 and LoTSS DR2 catalogues

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Accepted 2021 September 16. Received 2021 September 16; in original form 2021 June 25

## ABSTRACT

We present a search for transient radio sources on time-scales of 2–9 yr at 150 MHz. This search is conducted by comparing the first Alternative Data Release of the TIFR GMRT Sky Survey (TGSS ADR1) and the second data release of the LOFAR Two-metre Sky Survey (LoTSS DR2). The overlapping survey area covers 5570 deg<sup>2</sup> on the sky, or 14 per cent of the total sky. We introduce a method to compare the source catalogues that involves a pair match of sources, a flux density cutoff to meet the survey completeness limit and a newly developed compactness criterion. This method is used to identify both transient candidates in the TGSS source catalogue that have no counterpart in the LoTSS catalogue and transient candidates in LoTSS without a counterpart in TGSS. We find that imaging artefacts and uncertainties and variations in the flux density scales complicate the transient search. Our method to search for transients by comparing two different surveys, while taking into account imaging artefacts around bright sources and misaligned flux scales between surveys, is universally applicable to future radio transient searches. No transient sources were identified, but we are able to place an upper limit on the transient surface density of  $<5.4 \times 10^{-4}$  deg<sup>-2</sup> at 150 MHz for compact sources with an integrated flux density over 100 mJy. Here we define a transient as a compact source with flux density greater than 100 mJy that appears in the catalogue of one survey without a counterpart in the other survey.

**Key words:** catalogues – radio continuum: general – radio continuum: transients.

## 1 INTRODUCTION

There are several astrophysical phenomena that are known to be transient at low frequencies. These include events like stellar flares, magnetar flares, intermittent pulsars, and X-ray binaries. See section 4 of Bowman et al. (2013) for a review of the low-frequency transient radio sky. In this study, we focus on searching for previously unknown low-frequency (150 MHz) long-time-scale (> year) radio transients and extreme variables. Our search is sensitive to various phenomena, for example, active galactic nuclei (AGNs) are known to be variable on these time-scales (fig. 3 in Pietka, Fender & Keane 2015) and at these frequencies (Hajela et al. 2019). Both variable radio AGN (Williams & Berger 2016; Kunert-Bajraszewska et al. 2020; Nyland et al. 2021) and changing-look AGN (Wołoska et al. 2017, 2021) may be observed as transient radio emission. Intrinsic AGN variability can arise due to variations in accretion rate, flares and shocks in discs and jets, transitions between high and low states, changes in Doppler boosting and jet precession, and other processes taking place near the black hole (see Bignall et al. 2015 and references therein).

More recently, it has been found that tidal disruption events can have long lasting and detectable radio afterglows (van Velzen et al. 2015; de Vries et al. 2019; Anderson et al. 2020; Tingay, Miller-Jones & Lenc 2020; Ravi et al. 2021). Furthermore, the afterglow of a gamma-ray burst (GRB; Van der Horst et al. 2008; Chandra & Frail 2012) and neutrons star mergers can be seen up to decades after the event (Metzger, Williams & Berger 2015). These commonly searched for explosive events will generally have low flux densities at low frequencies (Metzger et al. 2015), and we do not expect to be sensitive to them in this study. For the same reason we do not expect to probe core-collapse supernovae. Next to intrinsic variability, a radio source may seem transient or variable because of propagation effects such as refractive scintillation (rather than diffractive scintillation; Rickett 1986). Refractive scintillation is caused by large-scale gradients in the interstellar density profile, which can alter the observed flux density and location of compact background sources if not taken into account properly (Spangler et al. 1989; Goodman 1997; Stinebring et al. 2000).

Transient searches at 330 MHz have yielded multiple detections, including an X-ray binary, an unclassified variable source varying on long time-scales (Hyman et al. 2002) and a rapidly varying source with flares on a minute time-scale (Hyman et al. 2005, 2009; Spreeuw et al. 2009). At 325 MHz, Jaeger et al. (2012) discovered multiple

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variable sources and a day-scale transient event with no apparent astronomical counterpart. They conclude that this event is likely due to coherent emission from a stellar flare. Short-time-scale stellar flares (see e.g. Lynch et al. 2017) will not be detected in this study but the long-term variability that is also found in these systems (Callingham et al. 2021) might be found in this long-time scale study. At 150 MHz variable sources have been detected by Sabater et al. (2021). Examples of a transient sources at low frequency include even shorter time-scale transients; see e.g. Stewart et al. (2016), Varghese et al. (2019), and Kuiack et al. (2020b), who find transients at 34 and 60 MHz.

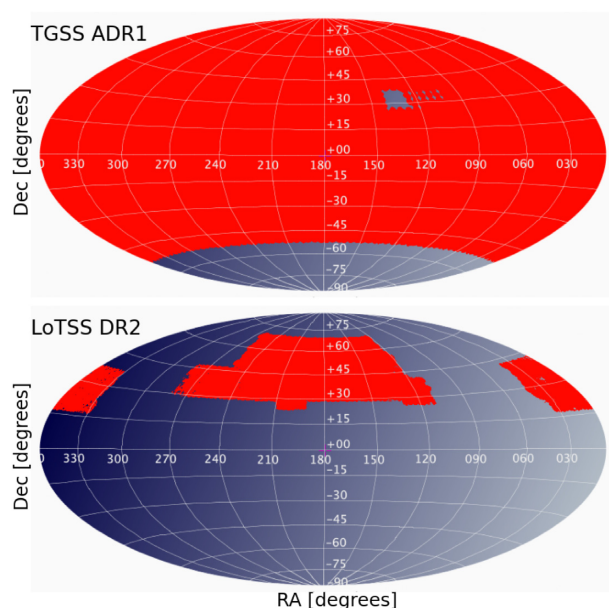
Apart from AGN and long-term variability in flare stars, the aforementioned studies are examples of low-frequency variables or transients which are most likely to be detected with repeated observations on short time-scales. Examples of long-time-scale transients are more sparse. Law et al. (2018) find a transient at 1.4–3.0 GHz fading over 23 yr. They interpret it as a synchrotron blast wave of a long GRB. The aforementioned studies are mainly examples of blind transient searches, but there are more examples of radio surveys at low frequencies targeted at for example microquasar V404 Cyg (Broderick et al. 2015; Chandra & Kanekar 2017), GW170817 (Broderick et al. 2020), and (off-axis) GRB (Mooley et al. 2021). The low-frequency long-time-scale transient radio sky remains largely unexplored. Most variable and transient phenomena are expected at shorter time-scales (Radcliffe et al. 2019), but comparing two readily available large radio surveys such as TGSS ADR1 and LoTSS DR2 still probes an interesting range of transient sources in an overlapping survey sky area of  $5570 \text{ deg}^2$ . The most important example to highlight the discovery potential comes from the work by Murphy et al. (2017), who find a 304-mJy transient of unknown origin on a 3-yr time-scale at 147.5 MHz, which roughly matches the time-scale and frequency of this work.

Next to the possible identification of transient phenomena, this study will put more stringent constraints on the transient rates. Two decades of research have consistently improved the constraints on the transient surface density at various flux density limits, time-scales and frequencies. See e.g. fig. 6 in Anderson et al. (2019) or fig. 8 in Murphy et al. (2017) for an overview of the transient surface density space. The latter figure makes a clear distinction between the time-scales of the transient searches. As can be seen from this figure transient searches with time-scales of over a year have only been conducted by Rowlinson et al. (2016) and Murphy et al. (2015) at time-scales of 1 and 3 yr, respectively. In this paper we present a search for radio transients at 150 MHz, over time-scales of 2–9 yr, to an integrated flux density cutoff of 100 mJy. This search is conducted by comparing the first Alternative Data Release of the TIFR GMRT Sky Survey (TGSS ADR1; Intema et al. 2017) at 150 MHz and the second data release of the LOFAR Two-metre Sky Survey (LoTSS DR2; Shimwell et al. in preparation) at 144 MHz.

## 2 METHODS

### 2.1 Description of the surveys

The Giant Metrewave Radio Telescope (GMRT; Swarup 1991) is an array of 30 45-m antennas near Pune, India. GMRT operates at frequencies between 150 and 1500 MHz. The maximum baseline is 25 km. The TGSS survey was carried out between 2011 April and 2012 March. Intema et al. (2017) have reprocessed the TGSS observations and produced the TGSS Alternative Data Release 1 (TGSS ADR1), which covers  $36\,900 \text{ deg}^2$  on the sky north of  $\delta = -53^\circ$  or 90 per cent of the total sky (see Fig. 1). TGSS ADR1 contains



**Figure 1.** Sky coverage of TGSS ADR1 (top) and LoTSS DR2 (bottom). The red areas indicate the sky covered by the respective surveys. The TGSS survey covers  $36\,900 \text{ deg}^2$  or 90 per cent of the total sky (Intema et al. 2017). The LoTSS survey consists of two fields, labeled the 0<sup>h</sup> and 13<sup>h</sup> field based on their Right Ascension. The LoTSS survey covers  $5\,720 \text{ deg}^2$  or 14 per cent of the total sky (Shimwell et al. in preparation). The missing coverage at low declination in TGSS is due to the declination limit of GMRT. The LoTSS survey is ongoing and will eventually cover the entire northern sky. The missing pointings (holes in the sky coverage) in both surveys are due to observing sessions with very difficult ionospheric conditions. This representation was created using ALADIN (Bonnarel et al. 2000).

the Stokes I continuum images and a source catalogue containing 623 604 radio sources, down to the  $7\sigma$  level. The catalogue reaches 90 per cent point-source completeness at 100 mJy. The continuum images have a median rms of  $3.5 \text{ mJy beam}^{-1}$  and a resolution of 25 arcsec. Due to the uv-coverage of the observations, the resolution drops off below declinations south of  $\delta = +19^\circ$ . These declinations are not considered in this work, as LoTSS DR2 only contains regions above this declination.

The Low Frequency Array (LOFAR; van Haarlem et al. 2013) is comprised of many thousands of dipole antennas arranged in stations. These stations are distributed in a sparse array with a denser core region near Exloo, the Netherlands, but extending out to remote international stations. The Dutch stations give a maximum baseline of 121 km, while the full international array gives a maximum baseline of 2000 km (van Haarlem et al. 2013). Whilst LOFAR Two-Metre Sky Survey (LoTSS; Shimwell et al. 2017) observations are taken using the full international array, the LoTSS DR2 utilizes data only from the Dutch stations. LoTSS observes between 120 and 168 MHz. The flux densities are given at the central frequency of 144 MHz. The survey will eventually cover the entire northern sky. The sky coverage of each data release increases for the ongoing survey (Shimwell et al. 2017, 2019). The second data release of LoTSS (LoTSS DR2; Shimwell et al. in preparation) consists of two discrete fields, denoted the 0<sup>h</sup> and 13<sup>h</sup> fields, covering  $5\,720 \text{ deg}^2$  in total (see Fig. 1). Observations for this data release have been made between 2014 May and 2020 February. The continuum images have a median rms of  $83 \text{ } \mu\text{Jy beam}^{-1}$  and a resolution of 6 arcsec. The LoTSS DR2 source catalogue contains 4395 448 sources and is 90 per cent point-source complete at an integrated flux density of 0.8

**Table 1.** Number of sources that is left after each search step as explained in Section 2.2.

	Total	No match	> 100 mJy	Compact	Visual
LoTSS	$4.3 \times 10^6$	$2.6 \times 10^6$	$2.0 \times 10^3$	60	16
TGSS	$1.0 \times 10^5$	$4.0 \times 10^2$	$1.5 \times 10^2$	$1.2 \times 10^2$	10

*Note.* The total number of sources refers to the number of sources in each survey in the overlap region of the two surveys.

mJy. The sensitivity difference between the two surveys is reflected in the number of sources in both catalogues. In the overlapping survey area, LoTSS DR2 contains  $4.3 \times 10^6$  sources while TGSS ADR1 contains  $1.0 \times 10^5$  sources.

## 2.2 Search strategy

‘Transients’ are often thought of as sources with a large amplitude of variability, that undergo brightenings only rarely, or even only once (cataclysmically). This is then taken in contrast with ‘variables’, thought of as objects that are usually present, but vary in brightness with relatively smaller amplitudes. However, this is a distinction we cannot generally make with discovery data such as in this study: by the nature of flux density distributions, most sources in a survey are close to the detection limit, including new sources. We can only learn by follow-up observations whether a new source we find is usually just below the detection threshold, or far below, and thus whether its outbursts have high or low amplitude and whether they are rare or common (e.g. Murphy et al. 2017). In this study, we therefore adopt the purely pragmatic definition that a transient is a source that definitely appears in one catalogue, and is without a counterpart in the other. Radio surveys, by their nature, are constructed with a certain flux or completeness limit, which is set such as to have a reasonable balance between false positives (included sources that are artefacts or noise) and false negatives (sources above the nominal threshold that are missed); inevitably, neither is zero, since the goals of surveys are mostly statistical. However, transients are quite rare, and thus when trying to find them by comparing two radio catalogues, the false positives and false negatives in them dominate the initial difference list. Therefore, much of the work in this study concerns finding stricter cuts on the catalogue data, by source type and source flux, which ensure sufficiently smaller error rates that we can call any differences in the restricted sample new or transient with reasonable confidence.

We conduct our search by comparing the TGSS ADR1 (Intema et al. 2017) and LoTSS DR2 (Shimwell et al. in preparation) surveys. The sky area covered by LoTSS DR2 is a subset of the TGSS ADR1 survey, as shown in Fig. 1. Except for a small patch around  $(\alpha, \delta) \sim (135, +30)^\circ$ , the total search area is simply defined by the total LoTSS DR2 area. Using these two surveys, one can make two comparisons to identify transients: compare all TGSS sources to the LoTSS sources and vice versa. This section describes a search strategy that applies to both the LoTSS to TGSS as the TGSS to LoTSS comparison. The steps are as follows:

(i) *Pair match* – We use the TOPCAT (Taylor 2005) sky ellipses pair match algorithm with a search radius of 1.0 arcmin to cross-match the catalogues. This algorithm compares the elliptical regions on the sky around all sources for overlap. Sources whose sky ellipse overlap are a match. In case there are multiple sources within the sky ellipse of one source, we select the ‘best’ match. The *Best match for each Table 1 row* output option implies that for each entry in one catalogue, only the best match from the other catalogue will appear

in the result. Here ‘best’ match means ‘closest’ – the match with the smallest distance between the two matched celestial positions along a great circle.<sup>1</sup> If we search for matches for all TGSS sources, each TGSS source will appear a maximum of once in the result, but sources from LoTSS may appear multiple times (or the other way around for the LoTSS to TGSS search). The join type determines which entries are shown in the resulting table based on a match in the catalogues. Here, we want a result table showing all sources in the first catalogue that are not matched to a source in the second catalogue. Therefore, the join type was set to *1 not 2*, resulting in a catalogue of TGSS sources without a match in LoTSS, or vice versa.

(ii) *Flux density cutoff* – We apply a flux density cutoff of 100 mJy on the sources without a match. This corresponds to the TGSS completeness limit (Intema et al. 2017) for the entire TGSS ADR1 survey. By setting this flux density cutoff, we prevent ourselves from interpreting sources below the completeness limit as false positive transient candidates. We experimented with a flux density cutoff of 50 mJy but find that the number of transient candidates left for visual inspection is almost 20 times higher for the LoTSS to TGSS search and about two times higher for the TGSS to LoTSS comparison. We settle on a flux density limit of 100 mJy to prevent enormous visual inspection tasks (with their own risk of error) for a relatively small scientific gain, as a 50-mJy limit is not significantly more constraining than a 100-mJy limit in the transient surface density phase space (see the right-hand side of Fig. 9).

(iii) *Compact sources* – We select only compact sources from the remaining sample. Based on light travel-time arguments, extragalactic sources that vary significantly on time-scales of years are necessarily compact. This step is further explained in Section 2.3.

(iv) *Visual inspection* – We perform a visual inspection of the remaining sources. Here we get rid of sources that were misidentified by the source finding algorithm, or sources that were right on the border of the coverage of one of the surveys.

Table 1 shows the number of transient candidates left after each of the aforementioned steps. The first row shows the number of transient candidates in the LoTSS to TGSS comparison. The second row shows the number of transient candidates in the TGSS to LoTSS comparison.

## 2.3 Compactness

To select compact sources, we follow a similar strategy as in Section 3.1 and fig. 7 in Shimwell et al. (2019). We also tried a strategy as in fig. 11 of Intema et al. (2017) to select compact sources but find that this is too strict for transient searches. We would rather have a few more sources to visually inspect than to disregard possible transient candidates too soon. In the future, as survey resolution and sensitivity increase, a more stringent compactness constraint might be necessary. This section is similar to methods in Shimwell et al. (in preparation) but we try to create a standard procedure that can be applied to both LoTSS DR2 and TGSS.

In short, we define compact sources by fitting an envelope to a preselected sample of compact sources. The criteria for these preselected compact sources are listed below. Finally, a fit is performed on the preselected compact sources that defines the boundary between compact and extended sources. Any source of the full catalogue (not just the subsample of preselected compact sources) that lies below this envelope is defined as compact. The criteria to find a sample of

<sup>1</sup><http://www.star.bris.ac.uk/~mbt/topcat/sun253/matchRowSelect.html>.



compact sources to perform the fit on are as follows. From the full catalogue:

(i) Select sources that are classified as ‘S’ in the catalogue by the source finder [PyBDSF (Mohan & Rafferty 2015) for both catalogues]. This source code corresponds to sources that are well fit by a single Gaussian.

(ii) Select sources with an integrated flux density greater than the completeness limit of the survey.

(iii) Select sources without other catalogue sources within 1 arcmin.

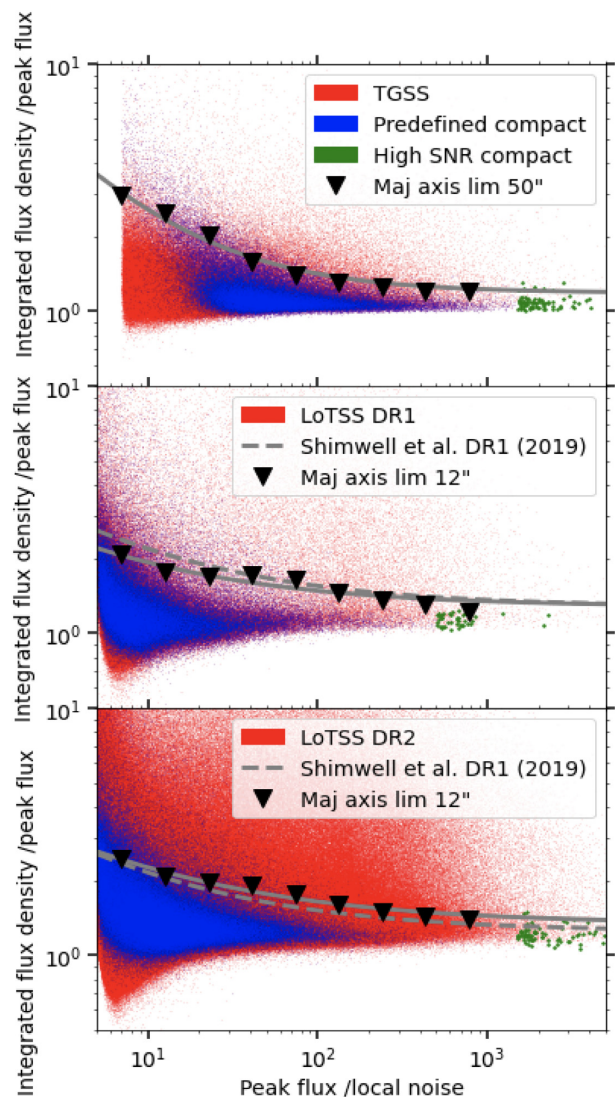
(iv) Select sources with a major axis smaller than two times the restored beam size. The restored beam size is 6 arcsec for LoTSS and 25 arcsec for TGSS (above  $\delta = 20^\circ$ ).

Step (ii) differs from the strategy in Shimwell et al. (2019) where they instead exclude sources that were not in the deconvolution mask in every pointing in which they are detected. We instead replace this requirement with a threshold on the integrated flux density, which, in the end, results in a similar compactness envelope. A constraint on the integrated flux density can also easily be applied to TGSS. Step (iv), the constraint on major beam size, is based on Shimwell et al. (2019) where a limit of 15 arcsec, i.e. 2.5 times the restored beam size, was chosen. We change this to two times the restored beam size as this seems to work well for both TGSS and LoTSS. A more conservative approach is to choose 2.5 times the restored beam size, which will result in a larger number of sources to visually inspect. We try both 2.5 and 2 times the restored beam size and find that it does not make a difference in the final number of transient candidates. It is important to have a constant restoring beam size throughout the survey for this requirement to make sense. For TGSS sources, we thus add an additional requirement on the declination,  $\delta > 20^\circ$ , as the restored beam size increases rapidly below this declination, which would interfere with the final condition. Note that we include all TGSS ADR1 sources to construct a compactness envelope, not just the sources that lie in the LoTSS DR2 field.

We plot the ratio of the integrated flux density to peak flux as a function of the ratio of the peak flux to the local noise for each source, as in Fig. 2. Fig. 2 shows the TGSS, LoTSS DR1, and LoTSS DR2, respectively. Since the criteria to find a sample of compact sources differ from the strategy in Shimwell et al. (2019), we re-analyse the same source catalogue (LoTSS DR1) to verify our compactness criterion for the TGSS and LoTSS DR2 surveys. The red points show the full source catalogues. The blue points show the predefined compact sample, constructed following the steps above. To separate extended from compact sources we fit an envelope with the functional form

$$\frac{S_{\text{int}}}{S_{\text{peak}}} = \text{offset} + A \times \left( \frac{S_{\text{peak}}}{\text{rms}} \right)^B, \quad (1)$$

which encompasses 95 per cent of the predefined compact sources. To this end, we define 10 peak flux to local noise (horizontal) bins and for each bin find the integrated to peak flux value that holds 95 per cent of the predefined compact sources. These 95 per cent values are shown with the downwards pointing triangles and are fit by the grey line. The offset in this envelope fit is defined by the median plus three times the median absolute deviation of the integrated flux density to peak flux ratio of seemingly compact high signal-to-noise ratio (S/N) sources. For the TGSS survey, we impose an S/N of 1500. For the LoTSS DR1 and DR2 surveys, we impose an S/N of 500. We visually inspect these high S/N sources to make sure that they are truly compact and that there are no obvious artefacts. The high S/N compact sources are shown in green in Fig. 2. The

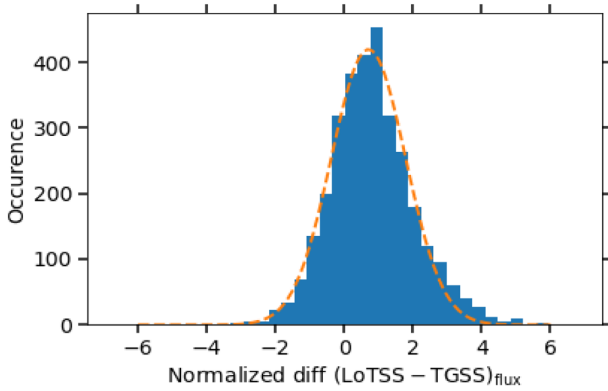


**Figure 2.** Ratio of the integrated flux density to peak brightness as a function of S/N for sources in the TGSS, LoTSS DR1, and LoTSS DR2 catalogue. All catalogued sources are shown in red and the sources we used to define a compact envelope in blue. The green points are high S/N sources used to determine the offset in the fit (equation 1), which is shown in grey. The downwards pointing triangles encompass 95 per cent of predefined compact sources in each horizontal bin. A more detailed description is given in Section 2.3. The fit parameters (equation 1) of the compactness envelopes in grey are shown in Table 2.

envelope fit parameters are given in Table 2. An additional dashed grey line is shown that represents the compactness envelope from Shimwell et al. (2019). Comparing the two envelopes shows that especially for high peak flux to local noise values they are almost identical. This is confirmed by the fact that the compactness envelope established in this work encompasses 83 per cent of all LoTSS DR1 sources, while the Shimwell et al. (2019) envelope encompasses 86 per cent of all LoTSS DR1 sources. We therefore conclude that the criteria to find compact sources, as defined in this section, are suitable to filter out compact sources and we apply these criteria to both the TGSS and LoTSS DR2 survey. The compactness envelope for LoTSS DR2 encompasses 81 per cent of all LoTSS DR2 sources. The compactness envelope for TGSS encompasses 91 per cent of all TGSS sources. Although the percentages given here might not seem

**Table 2.** The fit parameters (equation 1) of the compactness envelopes in grey in Fig. 2.

	Offset	A	B
TGSS (top panel)	1.19	8.39	−0.78
Shimwell et al. (2019) DR1 (dashed)	1.25	3.1	−0.53
LoTSS DR1 (middle panel)	1.28	2.10	−0.51
LoTSS DR2 (bottom panel)	1.34	2.79	−0.48

**Figure 3.** Flux density difference normalized with the root of the squared sum of the errors (as defined in equation 3). The median flux density difference is 0.70 and the standard deviation is 1.08. We overplot the best-fitting Gaussian to show the asymmetry in the distribution.

very constraining, Table 1 shows that the compactness criterion is crucial to reduce the number of transient candidates to an amount that can be visually inspected.

## 2.4 Flux density scale

To make sure that we can compare the flux densities of the TGSS and LoTSS survey, we should check that the flux density scales are properly aligned. Following the previous section, we select the compact sources in LoTSS that meet the following condition (see Section 2.3 and Fig. 2):

$$\frac{S_{\text{int}}}{S_{\text{peak}}} < 1.34 + 2.79 \left( \frac{S_{\text{peak}}}{\text{rms}} \right)^{-0.48}, \quad (2)$$

and are matched to a compact source in TGSS. Since extended emission is more likely to be fit by multiple ‘sources’ in the source finding algorithms, we select compact sources only, to make an accurate flux comparison. After selecting the compact sources, we select sources with a flux density over 100 mJy to match the TGSS completeness limit (Intema et al. 2017). We find 6097 compact LoTSS sources that are matched to a compact TGSS source brighter than the completeness limit. This small subset of the total number of sources is sufficient to estimate whether the flux density scales are aligned. Fig. 3 shows the LoTSS to TGSS normalized flux density difference, defined as

$$\begin{aligned} & \text{Norm. diff (LoTSS - TGSS)}_{\text{flux}} \\ &= \frac{S_{\text{int LoTSS}} - S_{\text{int TGSS}}}{\sqrt{(\Delta S_{\text{int LoTSS}})^2 + (\Delta S_{\text{int TGSS}})^2}}, \end{aligned} \quad (3)$$

where  $S_{\text{int LoTSS}}$  and  $S_{\text{int TGSS}}$  are the integrated flux densities of the source in the LoTSS and TGSS survey, respectively, and  $\Delta S_{\text{int LoTSS}}$  and  $\Delta S_{\text{int TGSS}}$  are the errors on the integrated flux density. Note that for TGSS,  $\Delta S_{\text{int TGSS}}$  can be taken directly from the catalogue,

as it includes both the statistical error on the total flux density measurement as the flux scale uncertainty, while the LoTSS catalogue only shows the statistical error on the total flux density measurement. Therefore, one should add the flux scale uncertainty of 10 per cent (Shimwell et al. in preparation) in quadrature to the flux density error in the catalogue to obtain  $\Delta S_{\text{int LoTSS}}$ . When the flux densities for the matched sources in TGSS and LoTSS would be aligned (within the errors), one would expect a normal distribution with a mean of zero and a standard deviation of 1. Fig. 3 shows that the Gaussian fit to the histogram peaks at 0.70 and the standard deviation is 1.08. Hence, the LoTSS sources have a systematically higher flux density. The ratio between the total integrated flux density of LoTSS and TGSS indicates that LoTSS sources have  $\sim 10$  per cent higher total flux density. Furthermore, the width of the distribution implies that sources are often further than the sum of the errors apart. The extended tail to the positive end of the distribution in Fig. 3 should be considered when searching for transient sources that are detected in the LoTSS survey but not in the TGSS survey. A large difference in flux density might cause the transient candidate to drop below the TGSS completeness limit. When searching for transients that are detected in TGSS but not in LoTSS this will be less of a problem because the completeness limit for LoTSS is much lower than for TGSS. A really small flux density difference is expected due to the frequency difference of the surveys, LoTSS is 144 MHz and TGSS is 150 MHz. However, the wide distribution as shown in Fig. 3 implies that the flux scales of TGSS ADR1 and/or LoTSS DR2 are/is fairly inaccurate. Finally, we note that the normalized flux density difference depends on the sky position position of the source. This effect has to be considered in the analysis of the significance of our transient candidates (Section 3.3).

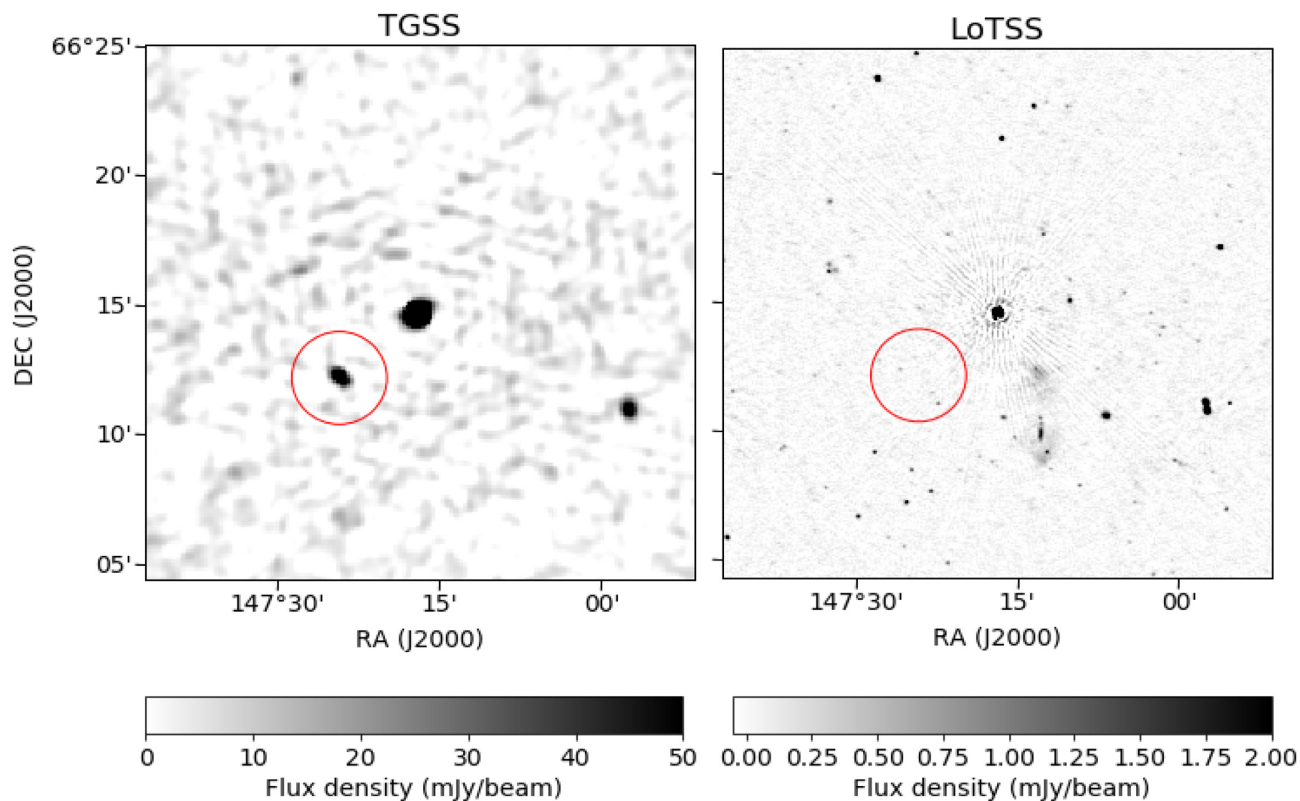
## 3 RESULTS

### 3.1 TGSS sources without LoTSS counterpart

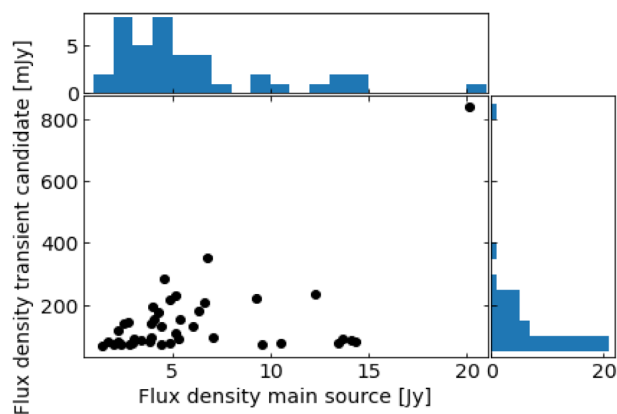
The search for transient sources in the TGSS survey leaves us with a sample of 10 transient candidates that are not found in the LoTSS survey. Table A1 in Appendix A shows the details of these sources. In Fig. 4, we show an example of a 175.5-mJy transient candidate. The left-hand panel shows the TGSS image, while the right-hand panel shows the LoTSS image. Both panels are centred on AGN 4C66.09, which has a flux density of 4.3 Jy. The location of the transient candidate, visible in TGSS but not in LoTSS, is indicated with a red circle.

We notice that all 10 sources in our final sample lie in close proximity to a bright source. A link to the TGSS and LoTSS images of all brighter than 100-mJy candidates can be found in the reproduction package. Keeping in mind previous studies like Frail et al. (2012) and Polisensky et al. (2016), which find source-like imaging artefacts around bright sources, we suspect our transient candidates to be imaging artefacts. To further explore the origin of the candidate transient sources in our sample, we increase our sample size by lowering the previously set flux density cutoff of 100–70 mJy and dropping the compactness criterion. By visual inspection, we now find an additional 31 sources that all lie in close proximity to a bright source, as was the case for our initial sample.

Fig. 5 shows the integrated flux density of all 41 sources in the new sample as a function of the close by bright/main source of 1.4–20 Jy. The flux density of the transient candidates is between 70 and 850 mJy. From Fig. 5, we do not find a clear relation between the flux density of the close by bright source and the flux density of the ‘transient’ source. We can however estimate a linear upper limit

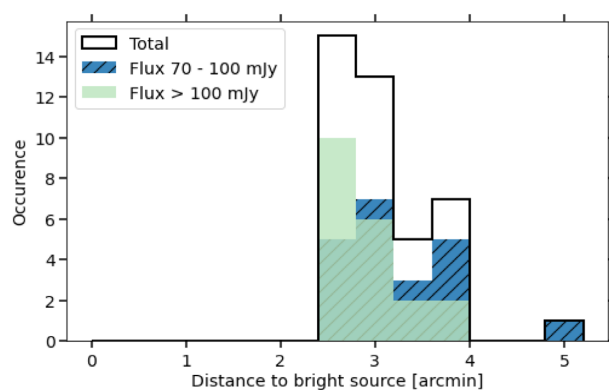


**Figure 4.** TGSS ADR1 (left-hand panel) and LoTSS DR2 (right-hand panel) images of the AGN 4C66.09 shown in the centre of the images. The red circle shows the location of the possible transient source (TGSSADR J094940.0+661228), visible in the TGSS image.



**Figure 5.** Integrated flux density of the transient candidates as a function of the integrated flux density of the close by main source. This figure includes all transient candidates with an integrated flux density over 70 mJy and without applying a compactness criterion (see Table A1 in Appendix A). This figure includes the transient candidates found in the TGSS survey without a LoTSS counterpart.

where the integrated flux density of the transient candidate is roughly 1/25th of the integrated flux density of the bright source, as might be expected for sidelobes of the point spread function. Fig. 6 shows the distribution of distances of the sources in our sample to the nearby bright source. The small range of distances of  $\sim 2.5$ – $4.2$  arcmin is striking. There is one source (TGSSADR J160357.5+572931) with a distance of  $\sim 5.2$  arcmin to the bright source. This source might be associated with a different bright source at roughly 1.4 arcmin.



**Figure 6.** Distribution of distances between the transient candidates and the close by main bright source. We make a distinction between the transient candidates with a flux density over 100 mJy (above the TGSS completeness limit) in green and sources with a flux density between 70 and 100 mJy that were only found after extending the sample, in striped blue. This figure includes the transient candidates found in the TGSS survey without a LoTSS counterpart.

Reimaging of the TGSS transient candidates with a newer version of the TGSS imaging pipeline shows that most emission at the location of the transient sources with an integrated flux density above 100 mJy (upper half of Table 1) is due to sidelobe artefacts. In the re-imaging process, the sidelobe artefacts from bright sources are suppressed more effectively than in the original imaging pipeline. We therefore conclude that our TGSS transient candidates are artificial effects of cleaning of a close by bright source. During subtraction of the point spread function, a certain amount of flux is mapped to the



location of the sidelobes of the point spread function. If this is not properly accounted for, this results in fake sources as seen before in, for example, Frail et al. (2012) and Polisensky et al. (2016).

### 3.2 Local noise around TGSS artefacts

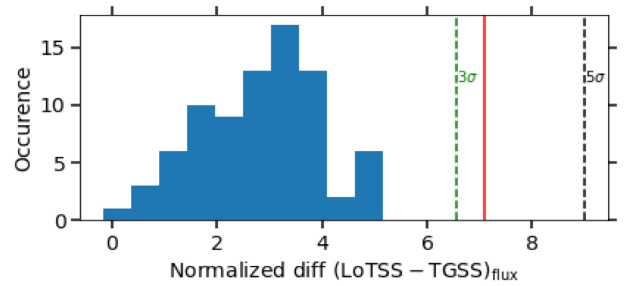
The noise properties of the skyregions where the TGSS transient candidates were found are analysed by comparing to the noise properties in the mosaic. All  $5 \times 5 \text{ deg}^2$  mosaics are divided in squares of  $20 \times 20 \text{ arcmin}^2$ . In each of these boxes a histogram of pixel values was created and fitted by a normal distribution. The mean and standard deviations of those distributions for all  $20 \times 20 \text{ arcmin}^2$  boxes are accumulated to form a new distribution. In those distributions of means and standard deviations, there was no clear evidence of under or overcleaning in the boxes where the transient candidates were found. For some transient candidate boxes, the mean or the standard deviation of pixel values was at one end of the distribution for the full mosaic, but no systematic behaviour was found.

### 3.3 LoTSS sources without TGSS counterpart

As discussed in Section 2.2, we follow the same simple strategy to search for transient sources that are detected in LoTSS but are not detected in TGSS. After applying a flux density threshold of 100 mJy to all LoTSS sources without a TGSS match, we apply the compactness criterion as described in Fig. 2. After visual inspection, we are left with 16 (see Table 1) potential transient candidates. Keeping in mind Fig. 3, we should design a strategy to evaluate our transient candidates, accounting for (sometimes) large flux density differences in LoTSS and TGSS. The large tail to the right-hand side of this distribution implies that there is a large number of sources where the LoTSS flux density is significantly higher than the TGSS flux density. To this end we perform a forced flux extraction on the location of the transient candidate in the TGSS survey using PySE (Carbone et al. 2016). This allows us to compare the flux density at a particular location between the surveys, although no source has been found by the source extractor in TGSS originally. Using this extracted flux density measurement, we evaluate the flux density at the location of the transient candidate in both surveys with respect to other sources in the local environment. The flux density difference between the two surveys at the location of the transient candidate should be compared to the local environment as the flux density difference is dependent on sky position. To this end, we construct a figure similar to Fig. 3 for all transient candidates, where we now only include the 80 sources closest to the location of the transient candidate. These 80 sources are a subsample of the full data set as described in Section 2.4, they are compact, brighter than 100-mJy sources that are found in both TGSS and LoTSS. We fit this distribution with a Gaussian.

An example of this method is shown in Fig. 7. The histogram shows the flux density difference between the two surveys for the 80 compact, brighter than 100-mJy sources around transient candidate ILT J180625.18+385035.1. These sources are used to define the local normalized flux density difference,  $(\text{LoTSS} - \text{TGSS})_{\text{flux}}$  as defined in equation (3), between the surveys. For the example in Fig. 7, the 80 sources are within  $4.7$  of the transient candidate. The flux density difference for the transient candidate is shown with a solid vertical red line, which, in this case, is more than  $3\sigma$  away from the centre of the Gaussian that was fit to the local distribution.

We apply this method to all 16 transient candidates and find six LoTSS sources where the flux density difference with respect



**Figure 7.** The histogram shows the normalized flux density difference (equation 3) between the two surveys for the 80 compact, brighter than 100-mJy sources around transient candidate ILT J180625.18+385035.1. These sources are used to define the local normalized flux density difference between the surveys. The flux density difference for the transient candidate is shown with a solid vertical red line, which is more than 3 standard deviations away from the local flux density difference distribution.

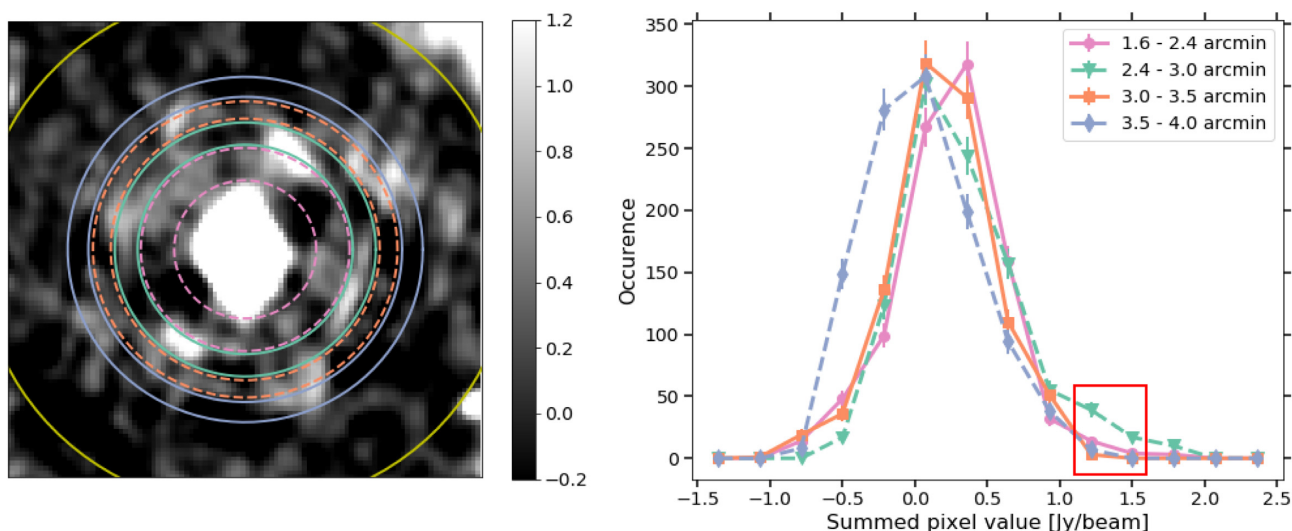
to the TGSS survey is significant to a  $3\sigma$  level. The LoTSS sources with a significant flux density difference to the TGSS survey are ILT J164033.71+383905.1, ILT J163248.84+374549.0, ILT J180625.18+385035.1 (Fig. 7), ILT J162817.33+401534.4, ILT J162915.48+655220.9, and ILT J092201.65+312144.8. These sources are reconsidered with a newer version of the TGSS imaging pipeline. It is found that for all sources the flux density increases after reprocessing, which is due to a different choice of primary beam calibrator in the new version of the imaging pipeline. Furthermore, some of the sources lie on the edge of two fields, where a field of poor quality significantly impacts the source properties. This implies that the flux density difference is pushed from above  $3\sigma$  (as in Fig. 7) to below  $3\sigma$  for all sources. We thus conclude that there are no significant transient sources in the LoTSS survey above 100 mJy.

## 4 DISCUSSION

### 4.1 Imaging artefacts around bright sources

Now that we know that our transient search suffered from imaging artefacts, we try to develop a method to reduce the impact of imaging artefacts in future studies. The easiest way to do so is to create a region around bright sources that is to be excluded from the transient search. This region should be as small as possible as one would like to keep the sky area searched for transients as large as possible. To this end, one can reconstruct residual dirty beam effects that are still in the survey by overlaying all bright sources that are modelled by a single Gaussian (source code S). For the TGSS survey specifically we choose sources with an integrated flux density above 2 Jy, based on Fig. 5 and Table 1. After selecting all sources with source code S, we excluded sources that have a catalogued brighter than 100-mJy source within a 6-arcmin proximity. If the cleaning process had been perfect, overlaying all the remaining sources should result in only a bright peak of emission in the centre of the overlayed images. The structure around this bright peak should be random since all sources with a flux density below 100 mJy (that are left) should average out.

To accumulate better statistics, we conduct this analysis with the full TGSS survey (not just the part overlapping with the LoTSS survey). There are 1144 brighter than 2-Jy single Gaussian sources without brighter than 100-mJy sources in 6-arcmin proximity. Fig. 8 shows the result of overlaying all these sources. The outer solid yellow circle has a 6-arcmin radius, within this circle we do not



**Figure 8.** The left-hand panel shows an overlay of all compact (S) TGSS sources with flux density over 2 Jy. We excluded the sources that have another source brighter than 100 mJy within 6 arcsec. Summing the images of the remaining sources (1144 in total) together to obtain effectively a reconstruction of the residual dirty beam effects. The histograms on the right show the pixel distributions in rings around the image centre. The pixel values of 1.0–1.5 Jy beam<sup>−1</sup> occur significantly more often at a distance of 2.4–3.0 arcmin from the image centre, compared to the other distances (see the red box). Furthermore, the pixel values at a distance of 3.5–4.0 arcsec are centred around zero, implying a random distribution and proper cleaning.

expect to find significant structure except for a bright central region. However, the image clearly reveals darker and brighter regions close to the image centre. The right-hand side of Fig. 8 shows a histogram of pixel values in rings at certain distances from the centre of the image. For visual clarity, these rings are also indicated on the image on the left-hand side. The distances of 1.6, 2.4, 3.0, 3.5, and 4.0 arcmin are chosen such that there is roughly an equal number of pixels in each ring. The histograms show that at a distance of 2.4–3.0 arcmin of the centre (green triangles, dashed line), there is an excess of bright pixels compared to the other distances (see the red box). This excess is also visible in the image on the left. The excess of bright pixels at a distance of 2.4–3.0 arcmin to the centre is significant compared to the other distances. This distance corresponds perfectly to the peak of the histogram of distances between the TGSS transient candidates and the close by bright sources (Fig. 6). Furthermore, Fig. 8 shows that starting from 3.5 to 4.0 arcmin, the pixel histogram is centred around zero, which implies a random distribution and proper cleaning. Therefore, for the TGSS survey, one should exclude regions within 4.0 arcmin of bright sources for the transient search.

## 4.2 Transient rates

Following Rowlinson et al. (2016), we calculate the transient surface density limit using Poisson statistics via  $P = e^{-\rho(N-1)\Omega}$ , where  $(N-1)\Omega$  is the total area surveyed by  $N$  snapshots of a field each with an area of  $\Omega$ ,  $\rho$  is the surface density limit, and  $P$  is the confidence interval. Following Bell et al. (2014), we use  $P = 0.05$  to give a 95 percent confidence limit. In this work,  $N = 2$ , since we are comparing images from two surveys, and  $\Omega = 5720 - 150 = 5570$  deg<sup>2</sup>. The sky area is simply the area of the LoTSS DR2 survey minus a small gap in the TGSS ADR1 survey (see Fig. 1). This results in a surface density estimate of  $\rho = 5.4 \times 10^{-4}$  deg<sup>−2</sup>. This result is only an upper limit since no transients were detected.

Fig. 9 shows our new result (navy cross) compared to other results in the literature. We show the most constraining studies

below 1 GHz. The structure of this plot was taken from Murphy et al. (2017), but a more up-to-date sample of the most constraining studies was compiled using an overview<sup>2</sup> from Mooley et al. (2016). Empty markers correspond to studies at frequencies above 154 MHz and triangle markers correspond to studies at frequencies below 149 MHz, all other markers describe studies conducted in between those frequencies. Markers with a downward pointing arrow represent upper limits. The Jupyter notebook used to create this figure is available in the reproduction package. The time-scale explored in our study ranges from 2 to 9 yr; therefore, we plot our surface density at a time-scale of 5.5 yr with an uncertainty of 3.5 yr. Fig. 9 also shows the predicted rates for a range of phenomena, as calculated by Metzger et al. (2015). The colored lines show the sky density of sources above flux density  $F_v$  for a frequency of 150 MHz. We have included predicted source rates for various source classes from fig. 3 in Metzger et al. (2015), specifically magnetars (blue); off-axis tidal disruption events (red), long GRBs with  $\theta_{\text{obs}} = 1.57$  (green), off-axis short GRBs (orange), and neutron star merger leaving black hole (black). For a detailed discussion of these models, we refer the reader to Metzger et al. (2015), but we would like to point out that the uncertainties associated to these models can be up to an order of magnitude.

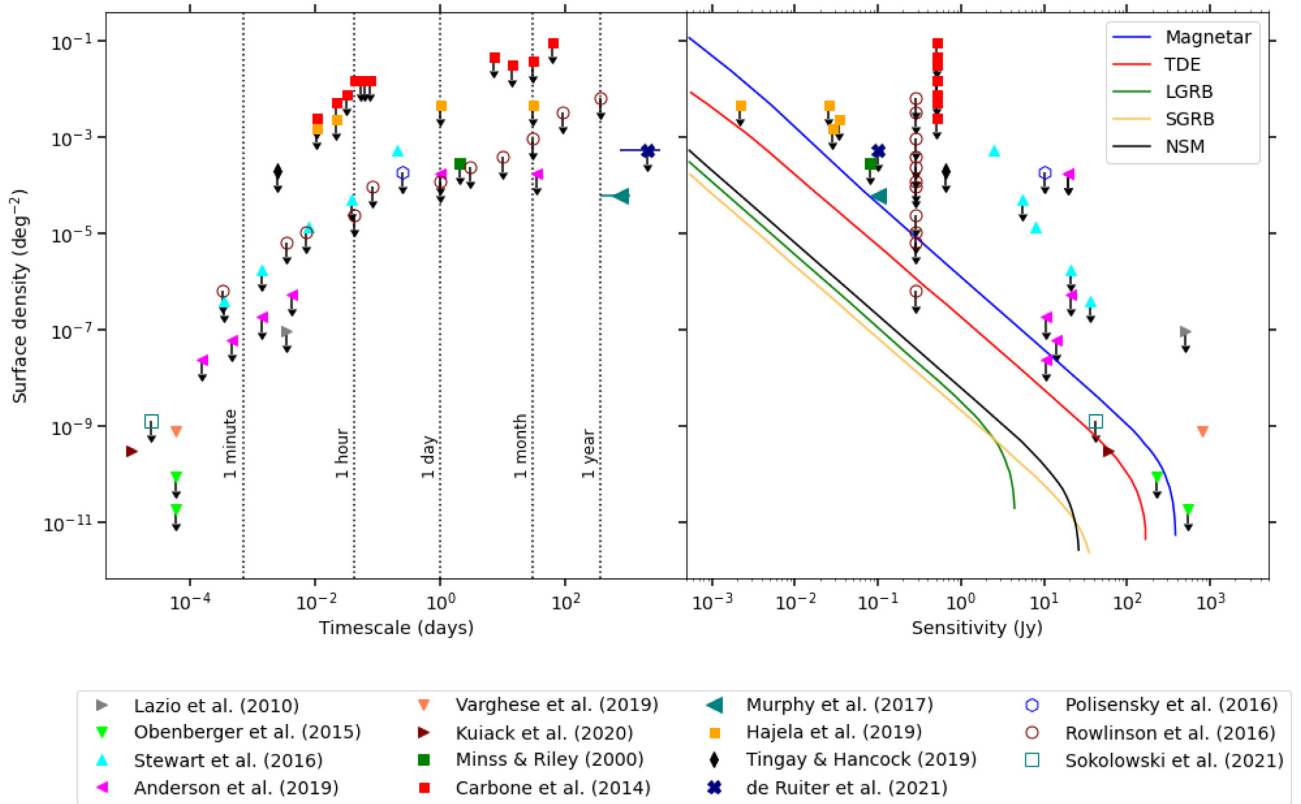
Although our study explores the transient sky at longer time-scales than ever before, the fact that we only find an upper limit combined with the limited sky area (compared to the Murphy et al. 2017 study) results in a surface density upper limit that is less constraining than previous results at similar sensitivities.

## 4.3 Long-term variability in AGN

Extragalactic radio sources primarily consists of star-forming galaxies and AGN. For the flux densities considered in this work (sources brighter than 100 mJy), the population is dominated by AGN (Wilman et al. 2008; Williams et al. 2016; Calistro Rivera et al.

<sup>2</sup><http://www.tauceti.caltech.edu/kunal/radio-transient-surveys/index.html>.





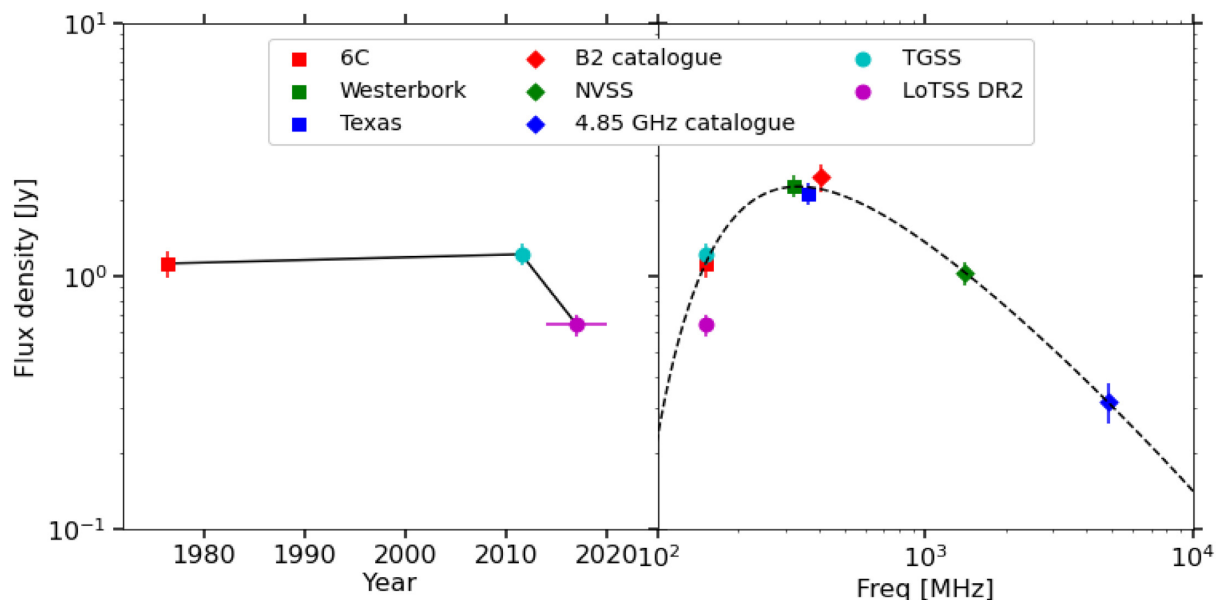
**Figure 9.** Limits on the transient rates from this study compared to previously published results. The result presented in this paper is shown as a dark blue cross. The horizontal error bar shows the uncertainty in time-scale, as the TGSS LoTSS data spans 2–9 yr. Triangle markers correspond to studies at frequencies below 149 MHz and empty markers correspond to studies at frequencies above 154 MHz; all other markers describe studies conducted between those frequencies. The coloured lines show the sky density of sources above flux density  $F_\nu$  for frequency  $\nu = 150$  MHz. See Metzger et al. (2015) for a detailed description of how these model predictions were calculated (Minns & Riley 2000; Lazio et al. 2010; Obenberger et al. 2015; Carbone et al. 2016; Polisensky et al. 2016; Rowlinson et al. 2016; Stewart et al. 2016; Murphy et al. 2017; Anderson et al. 2019; Hajela et al. 2019; Tingay & Hancock 2019; Varghese et al. 2019; Kuiack et al. 2020a; Sokolowski et al. 2021). Jupyter notebook and supplementary materials are available in the reproduction package.

2017). The slow transient radio sky is dominated by AGN emission, the majority of which are likely associated with variability (see e.g. Nyland et al. 2021). Assuming that all compact sources brighter than 100 mJy in this study are AGN, we can estimate the number of AGN that show this type of extreme long-term variability. Applying the compactness criterion as described in Section 2.3, we find  $7.1 \times 10^3$  compact brighter than 100-mJy sources in LoTSS and  $3.9 \times 10^4$  compact brighter than 100 mJy sources in TGSS. These numbers show that the compactness criterion is much more restrictive for LoTSS than for TGSS. This leads to a surface density estimate of AGN (at a flux density threshold of 100 mJy and 150 MHz) of  $1.3 \text{ deg}^{-2}$  in LoTSS. Including our previously discussed transient surface density upper limit, we estimate a maximum of one in  $2.4 \times 10^3$  AGN to show extreme long-term variability at 150 MHz above a flux density of 100 mJy. Here we divide the more conservative LoTSS AGN surface density estimate by the previously estimated transient surface density upper limit. Extreme long-term variability in this case means a variable source that can be interpreted as a transient source when comparing LoTSS to TGSS. As mentioned in Section 2.2 we can not estimate the amplitude of the variability a source would have to exhibit, for it to be identified as a transient in our search. Since the transient surface density is an upper limit, our estimate of AGN that show long-term variability is a limit as well. A maximum of one in  $2.4 \times 10^3$  AGN is expected to show extreme long-term variability.

#### 4.4 Search completeness

In this section, we describe some effects that might have had an impact on the transient search completeness. Some transient sources might have been overlooked because a single source at the resolution of LoTSS could be blended with another source at the resolution of TGSS. This happens when a transient source is close (in sky projection) to a steady source. An extreme example of this is when a transient occurs at the same location as a persistent source (Keane et al. 2016 and follow-up discussion by Williams & Berger 2016).

A second possibility is that we have missed transient sources due to false matches between the catalogues. This happens when a transient source has a positional coincidence with a source in the other catalogue. To quantify this effect, we conduct a similar study as in Murphy et al. (2017). We repeat the study as described in Section 2.2 by matching all compact brighter than 100-mJy LoTSS sources to the TGSS sources, after shifting the TGSS sources in a random direction. We add a random offset in right ascension and declination between 5 and 10 arcsec. This cross-matching yields a match for 37 of the 6651 sources. This implies that up to  $\sim 0.6$  per cent of the sources ruled out in our process could have been actual transient phenomena. The total number of transients in our comparison is below 1, which means that the expectation is that the number of sources we would miss due to this is less than 1. However, many classes of physical transients, such as radio supernovae, will occur at the same location



**Figure 10.** Light curves and spectrum of variable source J014946+362832 (ID 1 in Table B1). The light curve shows data at 151 MHz, including the 6C survey (Hales et al. 1993), TGSS ADR1 (Intema et al. 2017), and LoTSS DR2 (Shimwell et al. in preparation). The spectrum furthermore includes data from the Westerbork survey (Rengelink et al. 1997), the Texas survey (Douglas et al. 1996), the B2 catalogue (Colla et al. 1973), the NVSS catalogue (Condon et al. 1998), and a 4.85-GHz survey (Becker et al. 1991). Following Helmboldt et al. (2008), we fit the spectrum with  $Y = A + BX + C \exp(DX)$ , where  $Y = \log(F)$ , with  $F$  being the flux in Jy, and  $X = \log(\nu)$ , with  $\nu$  being the frequency in MHz. The fit parameters are  $A = 1.70$ ,  $B = -0.22$ ,  $C = -464.50$ , and  $D = -3.53$ . The TGSS and LoTSS data are not used for the fit.

as a persistent radio source (the host galaxy) and this is not accounted for in this analysis.

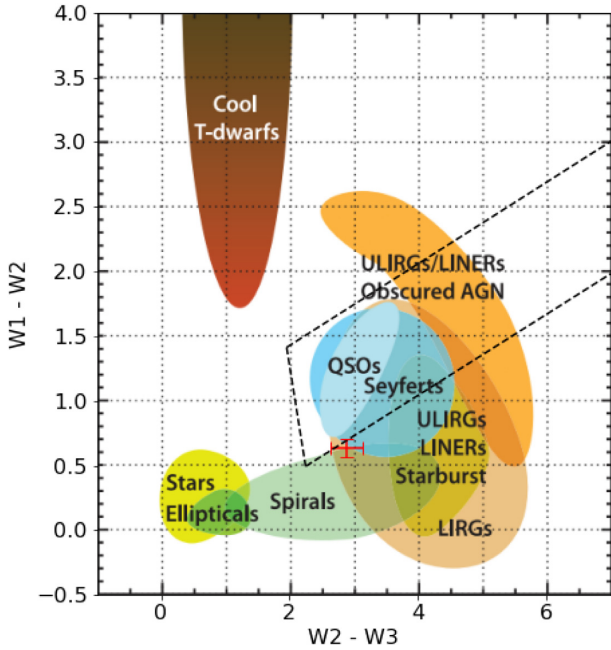
Finally, we could have missed transient sources if a compact source is shrouded by extended emission. In this case, it is not clear if a source finder will correctly identify both the compact source and the extended emission. We investigate this scenario by complementing our initial strategy with a direct comparison of LoTSS sources without a TGSS counterpart to the NRAO VLA Sky Survey (NVSS; Condon et al. 1998) at 1.4 GHz. The NVSS survey was conducted between 1993 and 1996 and has a median rms noise of 0.45 mJy beam<sup>-1</sup> and 45-arcsec resolution (Condon et al. 1998). We expect that the NVSS survey will detect the compact part of the LoTSS sources without TGSS counterpart because of the high frequency (where for most radio sources the flux density is higher) and low rms level of the NVSS survey.

Any source that is found in LoTSS but not in TGSS nor NVSS and has a flux density above 100 mJy might still be an interesting transient candidate. Since we apply no compactness requirement in this search, most of the candidates in our final sample show extended emission only. After visual inspection of the 25 LoTSS sources without TGSS nor NVSS counterpart, we find one source that has a compact and extended component (ILT J183846.09+325110.7). We investigate this source by recalculating the contribution to integrated flux density of the point source and the extended emission separately and find that the compact part only has an integrated flux density of 18 mJy. The extended emission contributes to the total integrated flux density such that the combination crosses the 100-mJy limit. Due to the sensitivity difference of TGSS to LoTSS we do not necessarily expect to find this point source in TGSS. Furthermore, we re-image the LoTSS data with the TGSS baselines and weighting and find that the extended emission is not visible for TGSS. All in all, we conclude that the number of transient candidates missed due to inadequate source finding of a combination of point source and extended emission, is negligible.

#### 4.5 Variability

Although we focus on transient sources in this study, we can easily perform a simple variability search using Fig. 3 by evaluating the tails of the distribution. Fig. 3 shows the normalized flux density difference (as defined in equation 3) for compact brighter than 100-mJy sources. We evaluate all matched sources where the flux density difference is larger than the median plus four times the standard deviation of the distribution, or smaller than the median minus four times the standard deviation. We find seven sources that satisfy these criteria. These sources are listed in Table B1. Except for the first source, all of these variable candidates are sources where the TGSS flux density is below the completeness limit of 100 mJy. We therefore suspect that most of these sources suffer from similar effects as described in Section 3.3, where poor TGSS image quality would significantly decrease the TGSS source flux density. Follow-up studies are needed to identify whether these sources are really variable. The only variable candidate where the flux significantly decreases from TGSS to LoTSS is source J014946+362832 (ID 1 in Table B1). The source type is unknown, but considering the flux density this variable source is most likely an AGN (Wilman et al. 2008; Williams et al. 2016; Calistro Rivera et al. 2017).

In Fig. 10, we show the light curve and the spectrum of this particular source. The light curve shows data at 151 MHz, including the 6C survey (Hales, Baldwin & Warner 1993), TGSS ADR1 (Intema et al. 2017), and LoTSS DR2 (Shimwell et al. in preparation). The spectrum also includes data from the Westerbork survey (Rengelink et al. 1997), the Texas survey (Douglas et al. 1996), the B2 catalogue (Colla et al. 1973), the NVSS catalogue (Condon et al. 1998), and a 4.85-GHz survey (Becker, White & Edwards 1991). Following Helmboldt et al. (2008), we fit the spectrum with  $Y = A + BX + C \exp(DX)$  where  $Y = \log(F)$ , with  $F$  being the flux in Jy, and  $X = \log(\nu)$ , with  $\nu$  being the frequency in MHz. The fit parameters are  $A = 1.70$ ,  $B = -0.22$ ,  $C = -464.50$ , and  $D = -3.53$ .



**Figure 11.** *WISE* infrared colour-colour space ( $W2 - W3$  versus  $W1 - W2$ ) from Wright et al. (2010) where we overplot the variable source J014946+362832 (ID 1 in Table B1) in red using data from Cutri et al. (2014). The dashed black line shows the infrared colour selection criteria for luminous AGNs in *WISE* defined by Mateos et al. (2012).

$= -3.53$ . The TGSS and LoTSS data are not used for the fit. Follow-up studies are necessary to identify whether the overall intensity of the source has decreased or the spectrum has steepened towards low frequencies. The fact that the spectrum is peaked is indicative of an underlying absorption mechanism. These absorption mechanisms are often associated with source compactness due to youth of the source and/or confinement by an external medium (O’Dea & Saikia 2021). Cutri et al. (2014) provide *WISE* infrared data for source J014946+362832. In Fig. 11, we show the location of the variable source in the *WISE* infrared colour-colour space ( $W2 - W3$  versus  $W1 - W2$ ). The source location is plotted in red and interesting classes of objects are shown in the background (fig. 12 from Wright et al. 2010). Furthermore, the dashed black line shows the infrared colour selection criteria for luminous AGNs in *WISE* defined by Mateos et al. (2012). Assuming that the source is most likely an AGN, Fig. 11 shows that J014946+362832 could be a luminous infrared galaxy (LIRG), QSO, or Seyfert. The figure also shows that the data point for J014946+362832 (including error bars) lies just at the edge of the region defining luminous AGN in *WISE*. More extensive (multiwavelength) follow-up studies are required to identify the source type.

#### 4.6 Future strategies

An improvement left for future work is a local noise dependent completeness limit. In this work we choose the completeness limit as described in Intema et al. (2017) as a cutoff for the complete survey. However, there are differences in data quality and rms noise throughout the survey. Therefore, a deeper transient search could be accomplished if one was to incorporate the local noise levels into this flux density cutoff. Low noise sky regions might yield a lower sensitivity than implied by the full-survey completeness limit and

thus a deeper transient search. In contrast, for high noise regions, a higher flux density cutoff might be applicable, reducing the number of false positives. Carbone et al. (2016) describe such a method in detail. To put such a strategy in place in future work, it would be helpful if radio surveys provided an rms map of the full survey area.

## 5 CONCLUSIONS

We present the results of a blind transient search at low frequency by comparing TGSS ADR1 and LoTSS DR2. We use the same universally applicable method to search for transients in TGSS that are not present in LoTSS and vice versa. The transient candidates we find are both imaging artefacts resulting from sidelobes of the point spread function at the location of bright sources and sources that are labelled as transient due to the large difference in flux density scales between the two surveys. We present methods to mitigate both these effects in future studies.

We conclude that there are no significant transient sources at a time-scale of 2–9 yr and a sensitivity of 100 mJy (TGSS ADR1 completeness limit), which leads to an upper limit on the transient rate of  $\rho < 5.4 \times 10^{-4} \text{ deg}^{-2}$ . This is an upper limit on the transient surface density at the longest time-scale to date, using our pragmatic definition of a transient (Section 2.2): a compact source that appears brighter than 100 mJy in the catalogue of one survey, without a counterpart in the other survey. We note that a radio transient was detected by Law et al. (2018) at an even longer time-scale (23 yr) than the ones explored in this study, but it was detected a higher frequency of 1.4 GHz. Repeating this study with the final LoTSS data release, which will cover the entire Northern sky (Shimwell et al. 2017), will at least put an upper limit of  $1.5 \times 10^{-4} \text{ deg}^{-2}$  on the transient surface density at decade long time-scale and a sensitivity of 100 mJy. However, an actual transient detection would provide more constraining values of the transient surface density. Finally, we estimate a maximum of one in  $2.4 \times 10^3$  AGN to show extreme long-term variability at 150 MHz above a flux density of 100 mJy. In future studies, an rms map of the complete surveyed area would be a valuable asset to conduct possibly deeper transient studies (see Carbone et al. 2016).

## ACKNOWLEDGEMENTS

IdR thanks Kelly Gourdji for fruitful discussions. GL thanks the Observatoire de la Côte d’Azur and the Anton Pannekoek Institute for making this joint research work possible. AD acknowledges support by the BMBF Verbundforschung under the grant 05A20STA.

This research made use of the TOPCAT (Taylor 2005) pair match algorithm, ALADIN (Bonnarel et al. 2000) for visual verification, ASTROPY (Astropy Collaboration et al. 2013, 2018) for FITS file handling, and MATPLOTLIB (Hunter 2007) to create plots.

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.

LOFAR is the Low Frequency Array designed and constructed by ASTRON. It has observing, data processing, and data storage facilities in several countries, which are owned by various parties (each with their own funding sources), and which are collectively operated by the ILT foundation under a joint scientific policy. The ILT resources have benefited from the following recent major funding sources: CNRS-INSU, Observatoire de Paris and Université d’Orléans, France; BMBF, MIWF-NRW, MPG, Germany; Science Foundation Ireland (SFI), Department of Business, Enterprise and Innovation (DBEI), Ireland; NWO, The Netherlands; The Science



and Technology Facilities Council, UK; Ministry of Science and Higher Education, Poland; and The Istituto Nazionale di Astrofisica (INAF), Italy.

This research made use of the Dutch national e-infrastructure with support of the SURF Cooperative (e-infra 180169) and the LOFAR e-infra group. The Jülich LOFAR Long Term Archive and the German LOFAR network are both coordinated and operated by the Jülich Supercomputing Centre (JSC), and computing resources on the supercomputer JUWELS at JSC were provided by the Gauss Centre for Supercomputing e.V. (grant CHTB00) through the John von Neumann Institute for Computing (NIC).

This research made use of the University of Hertfordshire high-performance computing facility and the LOFAR-UK computing facility located at the University of Hertfordshire and supported by STFC [ST/P000096/1], and of the Italian LOFAR IT computing infrastructure supported and operated by INAF, and by the Physics Department of Turin university (under an agreement with Consorzio Interuniversitario per la Fisica Spaziale) at the C3S Supercomputing Centre, Italy.

This research was funded through project CORTEX (NWA.1160.18.316), in research programme NWA-ORC, financed by the Dutch Research Council (NWO).

## DATA AVAILABILITY STATEMENT

The data underlying this paper are available in a reproduction package via Zenodo, at <https://dx.doi.org/10.5281/zenodo.4745528>.

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**Table A1.** TGSS to LoTSS transient candidates identified as imaging artefacts.

	‘Transient’ candidate source name	Flux density (mJy)	Close by bright source name	Flux density (Jy)	Distance (arcmin)	Compact
1	TGSSADR J122030.3+334531	838.0	TGSSADR J122033.7+334311	20.1	2.45	No
2	TGSSADR J123649.2+365757	350.6	TGSSADR J123649.8+365517	6.8	2.66	Yes
3	TGSSADR J151330.6+472410	286.1	TGSSADR J151322.2+472150	4.6	2.74	No
4	TGSSADR J130028.6+400541	237.1	TGSSADR J130033.0+400907	12.3	3.55	Yes
5	TGSSADR J124447.9+361156	230.6	TGSSADR J124449.5+360924	5.1	2.55	No
6	TGSSADR J154824.1+483721	220.6	TGSSADR J154814.5+483501	9.3	2.83	No
7	TGSSADR J160454.1+573014	214.8	TGSSADR J160434.3+572801	4.9	3.46	Yes
8	TGSSADR J215844.6+295639	207.5	TGSSADR J215842.0+295908	6.7	2.54	No
9	TGSSADR J145418.4+500554	196.6	TGSSADR J145408.2+500331	4.0	2.89	No
10	TGSSADR J155957.2+533830	182.8	TGSSADR J160016.7+533944	6.3	3.14	Yes
11	TGSSADR J094940.0+661228	175.5	TGSSADR J094912.2+661500	4.3	3.77	Yes
12	TGSSADR J094218.2+602247	155.3	TGSSADR J094151.2+602048	5.4	3.88	No
13	TGSSADR J003233.5+195607	152.0	TGSSADR J003238.3+195353	4.1	2.50	No
14	TGSSADR J152514.9+533637	146.9	TGSSADR J152501.8+533411	2.8	3.11	Yes
15	TGSSADR J150929.5+472914	141.6	TGSSADR J150920.0+472655	2.6	2.82	No
16	TGSSADR J125720.6+364641	141.0	TGSSADR J125723.7+364418	4.0	2.47	Yes
17	TGSSADR J232131.5+295504	132.2	TGSSADR J232143.9+295542	4.4	2.76	No
18	TGSSADR J140012.5+533936	129.1	TGSSADR J140018.9+533659	6.0	2.78	Yes
19	TGSSADR J145812.7+483518	118.5	TGSSADR J145802.0+483304	2.3	2.85	Yes
20	TGSSADR J154533.0+462506	108.2	TGSSADR J154525.3+462244	5.2	2.70	Yes
21	TGSSADR J115905.7+535541	97.3	TGSSADR J115913.7+535307	7.1	2.82	Yes
22	TGSSADR J161156.3+552133	95.6	TGSSADR J161212.5+552305	3.9	2.75	Yes
23	TGSSADR J145601.0+474314	92.8	TGSSADR J145551.0+474056	3.1	2.85	Yes
24	TGSSADR J010257.2+255016	92.6	TGSSADR J010250.1+255216	5.3	2.56	Yes
25	TGSSADR J012832.5+290615	89.0	TGSSADR J012830.1+290300	13.7	3.30	Yes
26	TGSSADR J011128.0+260317	86.9	TGSSADR J011121.3+260518	3.4	2.51	Yes
27	TGSSADR J153124.0+353739	86.4	TGSSADR J153125.2+353340	14.1	3.99	Yes
28	TGSSADR J004105.5+330653	83.5	TGSSADR J004054.9+331006	14.3	3.91	Yes
29	TGSSADR J124011.0+350516	82.5	TGSSADR J124021.1+350258	1.8	3.10	Yes
30	TGSSADR J133003.0+453824	81.6	TGSSADR J132942.1+453957	2.2	3.96	Yes
31	TGSSADR J132343.5+411344	81.5	TGSSADR J132323.9+411514	3.9	3.98	Yes
32	TGSSADR J152758.3+514444	78.1	TGSSADR J152746.7+514226	3.0	2.92	Yes
33	TGSSADR J225715.9+170059	77.2	TGSSADR J225707.1+165822	10.5	3.35	Yes
34	TGSSADR J003601.5+184017	77.1	TGSSADR J003606.4+183759	13.4	2.58	Yes
35	TGSSADR J160357.5+572931	76.2	TGSSADR J160434.3+572801	4.9	5.18	Yes
36	TGSSADR J100546.4+345530	73.9	TGSSADR J100601.7+345409	9.6	3.40	Yes
37	TGSSADR J004636.1+285054	72.6	TGSSADR J004642.9+284850	2.4	2.56	Yes
38	TGSSADR J154156.2+525316	71.8	TGSSADR J154144.7+525054	2.1	2.92	Yes
39	TGSSADR J093418.6+671828	70.7	TGSSADR J093346.4+672052	2.9	3.93	Yes
40	TGSSADR J084001.0+400146	70.7	TGSSADR J084011.4+400348	4.5	2.84	Yes
41	TGSSADR J154546.1+482919	70.0	TGSSADR J154535.8+482703	1.4	2.84	Yes

*Notes.* This table shows for each transient candidate the transient candidate source name, the transient candidate source flux density, the source name of the bright close by source, the source flux density of this bright source, the distance between the transient candidate and the bright source, and whether or not the transient candidates meet our compactness criteria (as discussed in Section 2.3 and Fig. 2). The 10 candidates with an integrated transient flux density brighter than 100 mJy (upper half of the table) that are compact as well as the 10 transient candidates as initially mentioned in Section 2.2 and Table 1. The other candidates in the table below are found after a follow-up where we decrease the flux density threshold to 70 mJy and drop the compactness criterion.

## APPENDIX A: TGSS IMAGING ARTEFACTS

The upper part of Table A1 shows the ten candidates that are left after visual inspection following the steps in Section 2.2 as mentioned in the second row of Table 1. These candidates have an integrated flux density above 100 mJy and are compact. Other sources in Table A1 were found in a follow-up, lowering the flux density threshold to 70

mJy and dropping the compactness requirement. TGSS and LoTSS images of all brighter than 100-mJy candidates can be found in the reproduction package.

## APPENDIX B: VARIABLE SOURCES

Table B1 shows a list of the variable sources identified via the methods described in Section 4.5.

**Table B1.** Compact TGSS sources that are matched to a compact LoTSS source where the normalized flux density difference (equation 3) is larger than the median plus four times the standard deviation or smaller than the median minus four times the standard deviation of the distribution shown in equation (3). These outliers are variable sources.

ID	Normalized diff	TGSS source name	Flux (mJy)	LoTSS source name	Flux (mJy)	RA (°)	Dec. (°)
1	−4.19	TGSSADR J014946.0+362832	1218.1	ILT J014946.05+362832.6	641.0	27.442	36.476
2	6.31	TGSSADR J023024.1+283520	28.7	ILT J023024.02+283521.5	117.1	37.600	28.589
3	5.59	TGSSADR J220546.1+292655	52.5	ILT J220546.51+292655.1	154.2	331.444	29.449
4	5.49	TGSSADR J144452.7+630712	55.1	ILT J144452.35+630711.6	146.9	221.218	63.120
5	5.15	TGSSADR J181549.8+382450	61.2	ILT J181549.94+382450.2	153.7	273.958	38.414
6	5.84	TGSSADR J132707.5+342336	39.1	ILT J132707.56+342337.9	114.3	201.782	34.394
7	5.05	TGSSADR J175246.4+355037	49.9	ILT J175246.50+355036.6	131.2	268.194	35.844

*Notes.* The columns show an ID, the normalized difference between the LoTSS and TGSS flux density difference, the TGSS source name and flux density, the LoTSS source name and flux density, and the RA and Dec. coordinates. The spectrum and light curve of source ID 1 are shown in Fig. 10.

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