

# A unique, ring-like radio source with quadrilateral structure detected with machine learning

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## ABSTRACT

We report the discovery of a unique object in the MeerKAT Galaxy Cluster Legacy Survey (MGCLS) using the machine learning anomaly detection framework ASTRONOMALY. This strange, ring-like source is 30' from the MGCLS field centred on Abell 209, and is not readily explained by simple physical models. With an assumed host galaxy at redshift 0.55, the luminosity ( $10^{25}$  W Hz<sup>-1</sup>) is comparable to powerful radio galaxies. The source consists of a ring of emission 175 kpc across, quadrilateral enhanced brightness regions bearing resemblance to radio jets, two “ears” separated by 368 kpc, and a diffuse envelope. All of the structures appear spectrally steep, ranging from -1.0 to -1.5. The ring has high polarization (25%) except on the bright patches (< 10%). We compare this source to the Odd Radio Circles recently discovered in ASKAP data and discuss several possible physical models, including a termination shock from starburst activity, an end-on radio galaxy, and a supermassive black hole merger event. No simple model can easily explain the observed structure of the source. This work, as well as other recent discoveries, demonstrates the power of unsupervised machine learning in mining large datasets for scientifically interesting sources.

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

## 1 INTRODUCTION

Over a billion radio sources are expected to be catalogued by surveys with the Square Kilometre Array (SKA, [Braun et al. 2015](#)). Already, the SKA precursor telescopes, such as MeerKAT ([Jonas & MeerKAT Team 2016](#)), ASKAP ([Hotan et al. 2021](#)) and LOFAR ([van Haarlem et al. 2013](#)), are producing datasets of remarkable size and richness. These datasets have proven to be a treasure trove for scientific discoveries, including Odd Radio Circles (ORCs [Norris et al. 2021](#)), the “heartworm” nebula ([Cotton et al. 2022](#)), a giant 5-Mpc radio galaxy ([Oei et al. 2022](#)) and many others. Even older large surveys, such as FIRST ([Becker et al. 1995](#)), have continued to reveal interesting new sources through intensive visible inspection in projects such as Radio Galaxy Zoo ([Banfield et al. 2015, 2016](#)). However, these discoveries were made by scientists and citizen scientists serendipitously noticing the unusual source and the increasing volume of modern datasets means that many interesting sources may be missed. An alternative to manual search is machine learning: a set of algorithms designed to automatically learn patterns and models from data, which has the potential to assist in rapidly sorting through data to locate interesting sources in large astronomical datasets. Recent unsupervised machine learning approaches have proven very effective at discovering radio

galaxies with unusual morphology ([Segal et al. 2019, 2022](#); [Galvin et al. 2020](#); [Mostert et al. 2021](#); [Gupta et al. 2022](#)).

ASTRONOMALY ([Lochner & Bassett 2021](#)) is a general machine learning framework for anomaly detection in astronomical data. It uses a novel active learning approach to optimally combine blind anomaly detection algorithms with a small amount of human labelling to quickly discard uninteresting anomalies, such as artefacts. This allows a scientist to focus most of their attention on a much smaller subset of interesting sources in the data. ASTRONOMALY has been used to detect optical galaxies with unusual morphology ([Walmesley et al. 2022](#)) and to discover anomalous optical transients ([Webb et al. 2020](#)).

In this work, we used ASTRONOMALY to search for sources with unusual morphology in the MeerKAT Galaxy Cluster Legacy Survey ([Knowles et al. 2022](#), MGCLS). MGCLS is a programme of MeerKAT L-band (900–1670 MHz) observations of 115 galaxy clusters. The full MGCLS survey contains ~ 720,000 sources, with an expected ~ 6,000 multi-component extended sources (extrapolated from extended source counts in two catalogued fields). While the size of this dataset may not seem particularly large, in practice it is an extremely rich dataset and many interesting sources have not yet been studied. During this search, ASTRONOMALY detected a source with unique morphology which was missed by scientists and is the subject of this paper.

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In Section 2 we briefly describe the process by which the source was discovered, Section 3 details reprocessing of the original MGCLS data. We present an analysis of the properties of the source in Section 4, discuss possible models in Section 5 and conclude in Section 6. We assume cosmological parameters from Planck Collaboration et al. (2020) throughout the paper.

## 2 METHODOLOGY

To detect interesting sources in the 115 images, covering 166 square degrees, from the enhanced MGCLS data products, we first ran the PyBDSF source-finding algorithm (Mohan & Rafferty 2015) with standard parameters. PyBDSF works by applying a threshold dependent on the local rms noise, and then detecting regions of contiguous emission, called islands. The islands are fit with a number of Gaussian components, which are usually used in radio source catalogues. However, because our focus is on sources with unusual morphology, we obtained better results by constructing the catalogue from PyBDSF islands rather than individual Gaussian components. We removed the majority of simple, uninteresting sources by requiring a minimum of four components per island. We then used the average position between the components as the source centre, and also determined the minimum size for the source using the island boundary. The final image for each source is thus scaled to ensure all emission is captured in a single cutout. We resized each image, interpolating if necessary, to 128x128 pixels.

We applied a standard sigma-clipping algorithm from ASTROPY (Astropy Collaboration et al. 2013, 2018, 2022), using a threshold of  $3\sigma$ . This algorithm uses an iterative approach to estimate the noise of the image and then masks pixels below the  $3\sigma$  threshold. This selects the brightest regions in the cutout but includes unrelated background sources that may confuse the machine learning algorithm. To correct for this, we applied a contour-fitting algorithm from OPENCV (Bradski 2000) to the masked image and selected only the emission contained in the central contour (assumed to be the source in question) thus removing the background sources. This approach resulted in a catalogue of 6332 extended sources.

After extracting cutouts of the sources, we followed a similar procedure as in Lochner & Bassett (2021) which works well for radio data despite originally being applied to optical galaxies. The approach combines simple morphological features with the anomaly detection algorithm isolation forest (Liu et al. 2008) to provide an initial ranking according to anomaly score. We note that due to technical failures in the feature extraction (usually for small sources with few data points), the total number of sources reduced to 6047.

ASTRONOMY ranks each object in the dataset according to anomaly score and presents these in a visual interface. We manually evaluated the 200 most anomalous sources, giving them a score out of 5 for “interestingness”. This is inherently subjective, but we focused on radio galaxies with complex and unusual morphology. Finally, we applied the novel active learning algorithm of Lochner & Bassett (2021) and sorted the data by the active anomaly score. Through this process, we discovered a source with very unusual morphology, which is the topic of this paper. We note that this source was ranked in the top 1.2% of the unlabelled data after applying active learning, illustrating how rapidly ASTRONOMY can discover interesting sources with only a very small amount of human labelling.

Located at right ascension and declination  $22^{\circ}.9895$ ,  $-13^{\circ}.5763$ , the source discovered by ASTRONOMY has a ring-like structure with four, uneven hot spots and ears extending to either side. It resembles an Odd Radio Circle (ORC, Norris et al. 2021) and in deference to

the ORC theme, we will refer to it as SAURON - a Steep And Uneven Ring Of Nonthermal radiation.

## 3 REPROCESSING OF THE ABELL 209 FIELD DATA

The enhanced MGCLS data products for the Abell 209 field include Stokes I, Q and U cubes, split into 14 frequency bins across 856–1712 MHz. See Knowles et al. (2022) for details on the observations and data processing. The images are centred at right ascension and declination  $22^{\circ}.9895$ ,  $-13^{\circ}.5763$  and focus on the inner  $1.2^{\circ} \times 1.2^{\circ}$  of the pointing. While we made use of the original Stokes Q and U cubes in our analysis, we used a reprocessed version of the Stokes I data to obtain a clearer view of SAURON.

We reprocessed the Abell 209 data (block ID 1538591458, 3 October 2018) following the workflow (OXXAT v0.3; Heywood 2020) that was implemented for the continuum imaging of the MIGHTEE survey (Jarvis et al. 2016) and described in more detail in Heywood et al. (2022). Briefly, the CASA package (McMullin et al. 2007) was used to apply flags to and generate calibration solutions from the primary (PKS 0408–65) and secondary (J0059+0006) calibrators. The solutions were applied to the target data, which were then flagged using the TRICOLOUR package (Hugo et al. 2022). Imaging and delay self-calibration was performed using WSCLEAN (Offringa et al. 2014) and CUBICAL (Kenyon et al. 2018), and facet-based direction-dependent corrections were applied using DDFACET (Tasse et al. 2018) and KILLMS (Smirnov & Tasse 2015).

Sub-band images for spectral indices were made in 11 frequency chunks of equal fractional bandwidth. A Briggs (1995) robustness of  $-0.4$  was used with a consistent Gaussian taper, and a tapered cosine window of width 400 wavelengths applied to the inner part of the  $u, v$  plane. The model images were convolved with a circular  $10''.5$  Gaussian. The residual images were convolved with a homogenisation kernel determined using the PYPHER package (Boucaud et al. 2016), and summed with the convolved model. Primary beam correction was performed using the KATBEAM<sup>1</sup> package.

Figure 1 shows the final total intensity radio image overlaid on optical data. The *griz* DES DR1 images were combined into an RGB image using a preprocessing function from ASTRONOMY<sup>2</sup> which rescales each band by multiplying by a given scale factor ( $g:6.0$ ,  $r:3.4$ ,  $i:1.0$ ,  $z:2.2$ ) and applying an arcsinh stretch. The  $i$  and  $z$  bands were combined to form the R plane, the  $r$  band was used for G and the  $g$  band for B. A Non-Local Means Denoising algorithm (Buades et al. 2011) was applied using OPENCV (with  $h = 17$ ) to remove a small amount of background noise and obtain a clearer picture.

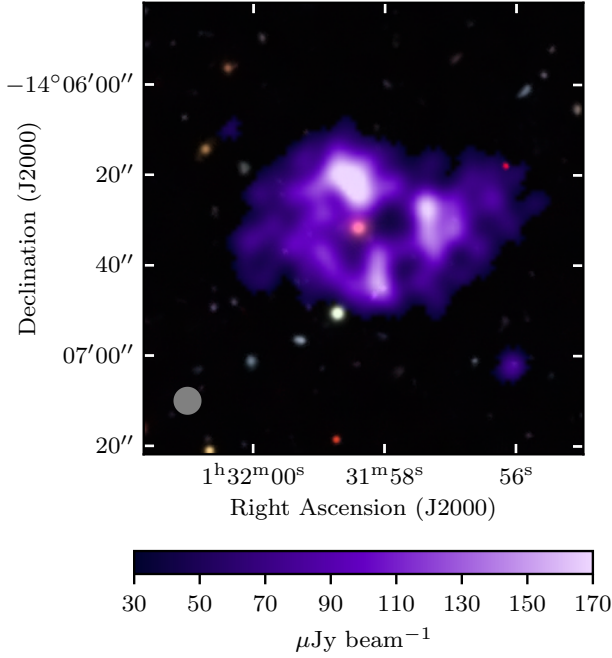
## 4 ANALYSIS OF SAURON

In order to understand possible mechanisms that may produce this source, we studied the morphology, spectral indices and polarization properties of SAURON, as well as any multiwavelength data available.

The most likely optical counterpart, seen at the centre of SAURON in Figure 1, is WISEA J013158.40-140631 (Wright et al. 2010). This galaxy has a photometric redshift of  $0.557 \pm 0.008$ , according to the DES Y3 GOLD catalogue (Drlica-Wagner et al. 2018; Sevilla-Noarbe et al. 2021). The infrared and photometric colours from WISE and

<sup>1</sup> <https://github.com/ska-sa/katbeam>

<sup>2</sup> [https://github.com/MichelleLochner/astrometry/blob/main/astrometry/preprocessing/image\\_preprocessing.py#L365](https://github.com/MichelleLochner/astrometry/blob/main/astrometry/preprocessing/image_preprocessing.py#L365)



**Figure 1.** Radio intensity (purple) overlaid on an optical image from the Dark Energy Survey (The Dark Energy Survey Collaboration 2005; Abbott et al. 2021; Morganson et al. 2018) indicating a possible centrally located counterpart at  $z=0.557$ . We set all pixels in the radio overlay below  $3\sigma$  to zero for cosmetic purposes, to ensure noise does not obscure the optical background. The colour bar is restricted to the range  $30 - 170 \mu\text{Jy beam}^{-1}$  to enhance the contrast. The synthesised beam (FWHM  $6.2''$ ) is shown in the lower left corner.

DES meet the criteria laid out in Zhou et al. (2022), making the host a likely Luminous Red Galaxy. There are no other galaxies in the DES catalogue within  $10''$  of the centre of the source.

Figure 3 shows all detected optical sources from the DECaLS DR8 catalogue (Dey et al. 2019) in the vicinity of SAURON, coloured by their photometric redshift<sup>3</sup>. While several galaxies are detected within the contours of the radio emission, they do not align convincingly with the radio peaks and are all found at different redshifts, suggesting they are unrelated background or foreground sources. The lack of optical counterparts for the hot spots and the excellent alignment of all hot spots with the ring makes it highly unlikely, but not impossible, that the hot spots and the ring are not connected to the same host galaxy and are simply a coincident alignment of unrelated sources.

The area around SAURON has a density of 1522 galaxies per square degree ( $r < 19.81$ )<sup>4</sup>, meaning there is only a 3.7% probability of coincidentally detecting a source of this brightness in a  $10''$  radius around the centre of the source. For the rest of this paper, all size and distance measurements are made under the assumption that this is the correct host galaxy and using the cosmological parameters from

<sup>3</sup> We use DECaLS for this particular figure because the catalogue has been produced with fewer cuts than the DES catalogue. So while this will include likely false positive sources, it is the most conservative test to look for any possible counterparts for the hot spots.

<sup>4</sup> Using the DES DR2 MAIN table and selecting all objects with quality flags less than 4 and EXTENDED\_CLASS\_COADD > 2 in a square degree box around SAURON.

(Planck Collaboration et al. 2020). Unlike other ORCs with central hosts, we find no evidence of radio emission, with a  $3\sigma$  upper limit of  $30 \mu\text{Jy}$ , or  $< 0.8\%$  fractional luminosity.

The source does not appear to be in any known cluster or group of galaxies. Quantifying the true density of the environment is difficult without a large sample of spectroscopic redshifts. However, the photometric redshift distributions from the DES Y3 GOLD sample indicate a  $7.2 \pm 2.5\%$  excess of galaxies in the redshift range  $0.5 - 0.6$  in a  $10'$  radius region around SAURON compared to the background (averaged over 500 independent regions of similar size). It thus does appear that SAURON may be in a slightly overdense region.

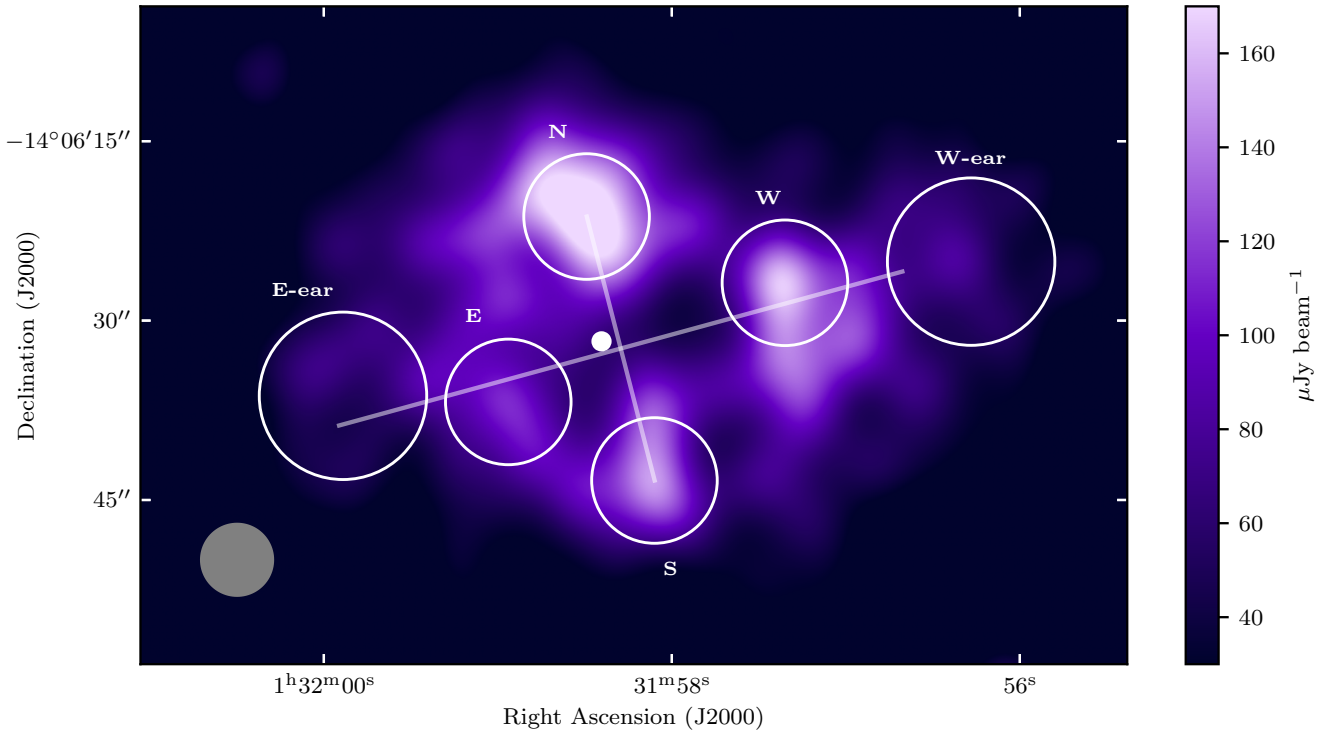
The regions of interest we refer to throughout the paper are shown in Figure 2. SAURON has four “hot spots”, with the east hot spot being considerably fainter than the others. It also has two ears embedded in the envelope. Its structure suggests quadrilateral symmetry, as indicated by two perpendicular lines - one connecting the north and south hot spots, the other bisecting the first and at a  $90^\circ$  angle. While this symmetry is not perfect, it is compelling, and any physical model must be able to explain both the ring and the structure of the hot spots and ears. At the redshift of the assumed host (0.557), SAURON’s ring is 175 kpc in diameter; the ears and broader envelope are at least 370 kpc in extent. Its peak brightness is  $0.2 \text{ mJy beam}^{-1}$  with an integrated flux density of  $3.9 \text{ mJy}$ . This corresponds to a monochromatic 1.4 GHz rest frame luminosity of  $\sim 10^{25} \text{ W Hz}^{-1}$ , in the range of powerful radio galaxies.

Figure 4 shows plots of the spectra for the features defined in Figure 2. The spectral indices are estimated using a simple weighted least squares method. We average over an aperture of diameter  $10.5''$  for the hot spots and  $14''$  for the ears. The higher frequency bands contain some visually spurious points which may result from residual radio frequency interference, and may bias the spectral index estimates at a level of  $\pm 0.2$ . More robust spectral indices from on-axis observations of SAURON would be useful to quantify the variations between individual features. The fact that the hot spots all have a similar spectral index to each other and the ring, and that spectral index ( $\sim -1.2$ ) is quite different from the average spectral index of galaxies in the MGCLS catalogue ( $\sim -0.7$ ) is further evidence that the hot spots and ring form part of the same source and are not coincident alignments. Figure 5 shows the spectra calculated by averaging the flux density in  $10''$  rings from the centre of the source. There is a clear drop in flux density in the centre of the source. The spectrum appears relatively constant with radius, with marginal evidence for a steeper spectrum in the centre.

Figure 6 shows the source polarized flux density, corrected for the noise bias, using only the range 908 – 1145 MHz where the signal:noise was highest. The vectors indicate the inferred magnetic field direction, after correcting for rotation measure (RM), and have uncertainties of  $\sim 10^\circ$ . The RMs were derived from least-squares fits to Q and U at the peaks of polarized emission for the entire range of frequencies, and gave values in the range  $3 - 8 \text{ rad m}^{-2}$ . Characteristic errors were  $\sim \pm 5 - 10 \text{ rad m}^{-2}$ . The distribution of residuals is non-Gaussian, so the error estimate depends on the choice of how spurious individual values were excluded from the calculation. The Galactic foreground is  $\sim 1 \pm 5 \text{ rad m}^{-2}$  in this direction,<sup>5</sup> so there is no strong Faraday contribution local to SAURON. Away from the hot spots, the fractional polarizations are  $\sim 25\%$ , similar to that seen for ORC1 Norris et al. (2022). However, there is no evidence for polarized emission associated with the hot spots. The observed

<sup>5</sup> Using the CIRADA RM cutout server (<http://cutouts.cirada.ca/rmcutout/>) based on Hutschenreuter et al. (2022).





**Figure 2.** Total radio intensity (purple) with annotations overplotted indicating the four hot spots (N, S, E and W), the two ears (E-ear and W-ear), the possible host galaxy (dot in the centre) and two perpendicular lines suggesting quadrilateral symmetry between the regions of interest. The size of the regions also indicate the areas used to compute the spectral index in Figure 4, which are  $10.5''$  diameter for the hot spots and  $14''$  for the ears. The colour bar is restricted to the range  $30 - 170 \mu\text{Jy beam}^{-1}$  to enhance the contrast. The synthesised beam (FWHM  $6.2''$ ) is shown in the lower left corner.

fractional polarizations of 3-5% appear to contain contributions from the surrounding polarized ring emission. Conservatively, we can set an upper limit of  $\sim 10\%$  on the hot spot polarized fractions, but the actual value is likely considerably smaller. The fact that the regions of high polarization do not align with the hot spots implies they are not simply enhanced regions of the ring and rather arise from a different physical process.

There are no sensitive public X-ray data available for SAURON. However, a brief investigation of *SRG's eRosita* (Predehl et al. 2021) data in this region revealed no X-ray emission from the position of the host, at an approximate sensitivity of  $10^{-13} \text{ erg s}^{-1} \text{ cm}^{-2}$  (Churazov, E., Sunyaev, S., Khabibullin, I., private communication), corresponding to an approximate luminosity of  $< 10^{45} \text{ erg s}^{-1}$ . Thus, there is not a high luminosity AGN present, although more sensitive observations would be needed to rule out less luminous AGN activity (Fotopoulou et al. 2016).

## 5 ORC PHYSICAL MODELS

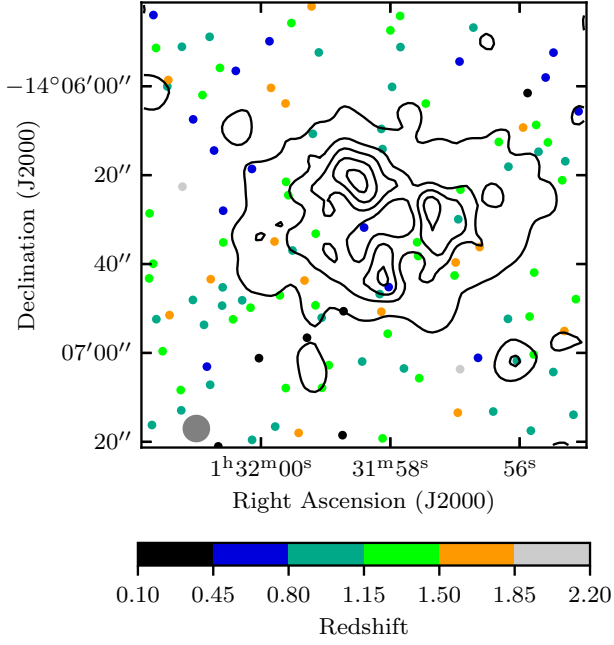
In many ways, SAURON is similar to the ORCs with central hosts described by Norris et al. (2022). Despite their very different morphological appearances, the similarities between ORC1 and SAURON are striking, as seen in Table 1. Thus, much of the detailed analysis of physical models by Norris et al. (2022) applies to SAURON as well. Some derived parameters would change, e.g., SAURON has the same luminosity but a smaller emitting volume, so the magnetic fields are likely somewhat higher. But the overall conclusions remain – the sizes, luminosities, energetics, radio spectra, radiative timescales,

Property	ORC1	SAURON
Integrated flux density (mJy)	3.9	3.9
Redshift	0.55	0.55
Spectral index	-1.4 <sup>a</sup>	-1.4
Ring % polariz.	15-30	10-28
Ring/Interior brightness <sup>b</sup>	1.7	1.6
Diameter (kpc)	520	370 (175) <sup>c</sup>
% host flux density	2.7	<0.8
WISE W1 (mag)	15.065	15.058
W1-W2 (mag)	0.081	0.001
W2-W3 (mag)	<2.1	<2.6
DES g-r (mag)	1.9	1.79
DES r-i (mag)	0.87	0.82

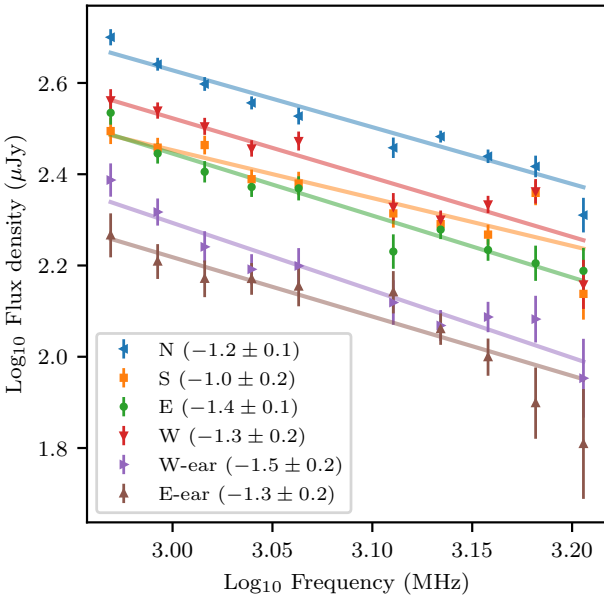
**Table 1.** Comparison of SAURON and ORC1 (values taken from Norris et al. (2021, 2022)). The only two values that are significantly different between the two sources are noted in italics. Notes: a. Multi-telescope spectral index; b. Average radio brightness of ring / central emission, reanalysed here for ORC1. c. Full diameter, (ring diameter).

etc. can all be plausibly explained by several different ring-producing mechanisms. These include a termination shock from intense starbursting activity, an explosion following the merger of SMBHs, and the end-on view of a radio galaxy. Each of these possible mechanisms also had significant flaws, for example, the unexplained interior arcs of ORC1, so the models are currently incomplete.

SAURON, too, creates difficulties for these simplest scenarios. Its host has no detectable radio emission, so support for either AGN or starburst activity is lacking.

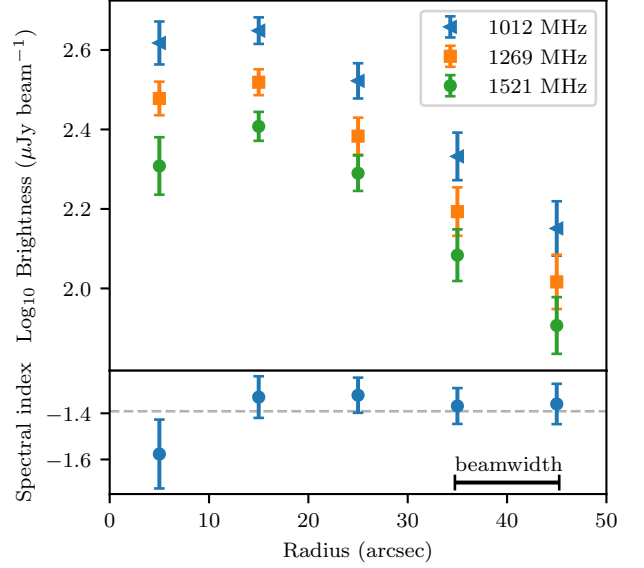


**Figure 3.** Total intensity contours at  $(3, 10, 15, 20, 25) \times$  the rms value of  $7.3 \mu\text{Jy beam}^{-1}$  with all galaxies in the region from the DECaLS DR2 catalogue plotted in colours corresponding to their photometric redshift estimate. The synthesised beam (FWHM  $6.2''$ ) is shown in the lower left corner.

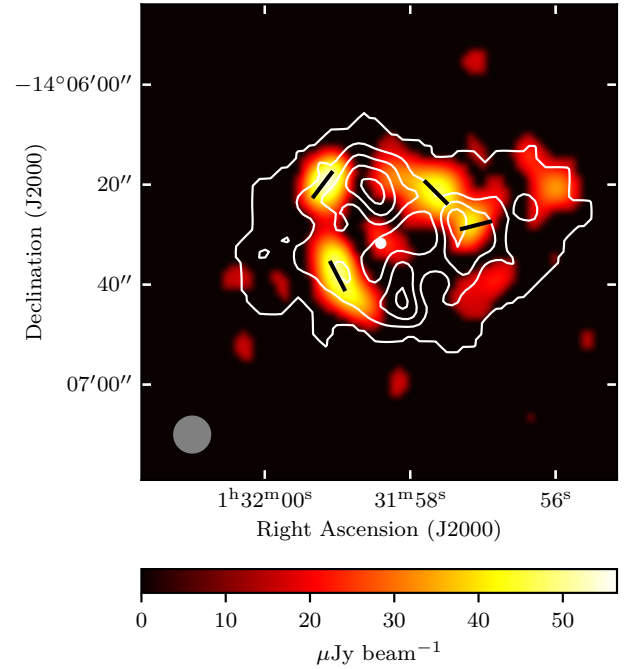


**Figure 4.** Spectrum of various regions (defined in Figure 2) of SAURON. The spectral index of each region is given in the legend with its error.

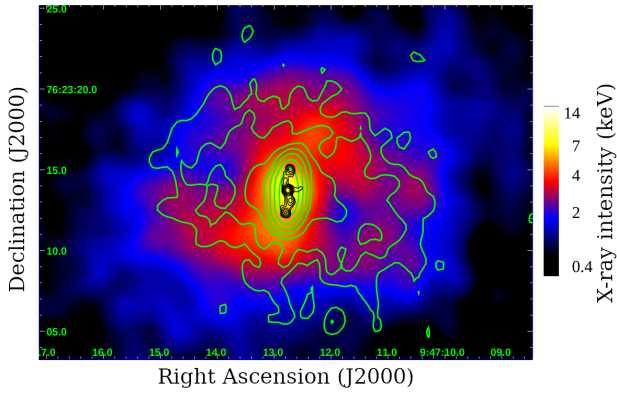
The N-S structures in SAURON are very similar in appearance to radio jets/lobes (Figure 1), and have significantly lower fractional polarizations than the rest of the ring, suggesting they may have formed differently. Although ORC1 contains some relatively low fractional polarizations on its bright polarized ring, we re-examined



**Figure 5.** *Top* - radial profiles of the brightness averaged over three sets of frequency channels, labeled with the central frequencies in each set. *Bottom* - the average spectral index over all frequency channels.



**Figure 6.** Average bias corrected polarized flux density, over the range 908 – 1145 MHz in orange and white total intensity contours at  $(3, 10, 15, 20, 25) \times$  the rms value of  $7.3 \mu\text{Jy beam}^{-1}$ . Black vectors indicate the inferred magnetic field directions at the positions of the four peaks in polarized intensity, after correction for the local RM. The white dot at the centre represents the potential host galaxy and background emission is removed with sigma clipping at a  $\sim 3\sigma$  level for the total intensity contours. The synthesised beam (FWHM  $7.6''$ ) is shown in the lower left corner.



**Figure 7.** 1.4GHz (green) and 4.8GHz (black) VLA radio contours overlaid onto the Chandra X-ray image for the possible binary black hole in RBS 797 (figure adapted from [Gitti et al. \(2006\)](#)).

those images and found that these low polarization regions did not correspond to ORC1's brightest patches as they do in SAURON.

Orthogonal to the N-S jets, we find more amorphous brightness enhancements, including the ears. This overall quadrilateral structure is reminiscent of a source in the RBS 797 cluster ([Figure 7](#)), a likely pair of twin radio jets forming and filling four X-ray cavities ([Ubertosi et al. 2021](#)). The authors of that study propose that the RBS 797 source is a merging SMBH system, with VLBI information suggesting that the two sets of jets represent either a re-orientation of the central ejection axis or separate ejections from the two SMBHs. RBS 797 has one set of well-collimated jets (coincidentally, N-S) while the orthogonal ones are more diffuse. In SAURON, the situation could be similar, e.g., with the ears representing an earlier phase of jet activity, and therefore weaker than the N-S jets. RBS 797's radio spectral indices are similar to those of SAURON (in the range of  $-1.1$  to  $-1.3$ ), and they have the same monochromatic radio luminosities,  $\sim 10^{25}$  W/Hz ([Gitti et al. 2006](#)). One important difference is that RBS 797 is on a significantly smaller physical scale (roughly 30 kpc) in diameter.

On larger scales, [Chon et al. \(2012\)](#) detected X-ray cavities in the well-studied radio source, Cygnus A. They suggested that this was evidence of previous AGN activity. [Krause et al. \(2019\)](#) went further to suggest Cygnus A shows strong evidence of precession and argue, by studying several well-resolved radio galaxies, that sub-parsec supermassive binaries may be common in powerful radio sources. It is interesting to note that the model for merging SMBHs developed by [Merritt & Ekers \(2002\)](#) predicts an extremely rapid  $90^\circ$  spin flip of the central black hole. While this may not be a general result, it could naturally explain the unique quadrilateral structure of SAURON.

Recently, [Dolag et al. \(2022\)](#) used advanced simulations to demonstrate that ORC-like structures could emerge naturally as a result of shocks produced by extreme galactic merger events which result in a galaxy with a virial mass of  $10^{13} M_{\text{sun}}$ . An alternative explanation, suggested by [Omar \(2022\)](#), is that ORCs could be produced by shocks from  $10^5 - 10^9$  tidal disruption events around the central massive black hole in a post-starburst galaxy.

Whether or not the merging SMBH and two pairs of jets scenario holds, we are left with the challenge of explaining both the existence of the ring, and the quadrilateral structure, including the ears, for SAURON. None of the simple scenarios are sufficient, similar to the situation for ORC1, although one or more is likely to be playing a role.

## 6 CONCLUSIONS

The unusual source we have called SAURON is the first (to our knowledge) scientific discovery made with machine learning in MeerKAT image data. The anomaly detection framework, ASTRONOMALY, easily detected SAURON, although it had not been previously spotted by the many people working on the MGCLS. SAURON shares many properties with ORCs, particularly ORC1. SAURON is thus likely explained by one or more of the physical models explored for the ORCs, including a termination shock from intense star-bursting activity, the end-on view of a radio galaxy and an explosion following the merger of SMBHs. Notably though, SAURON demonstrates unusual quadrilateral morphology with low polarization in the brightest regions, which differs from ORC1. These results, and the fact that there is no detectable radio emission from the likely host galaxy, disfavours the star-burst and end-on radio galaxy scenarios, but does not rule them out. The quadrilateral structure of SAURON seems supportive of a merging SMBH origin and resembles another such system in RBS 797; however the SMBH model does not explain the observed ring or ears without additional complexity.

Radio observations with SAURON on axis, and also at lower frequencies, may reveal a clearer picture of the morphology and polarization structure, while deep X-ray observations could provide support for the SMBH scenario. Additionally, detailed hydrodynamic simulations using the physical models discussed are needed to fully explain SAURON and other similar ORCs. We expect to discover many more anomalous sources in radio data using techniques such as ASTRONOMALY, which will likely continue to push our understanding of radio galaxies and the physics of extreme energetic events.

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The Legacy Surveys consist of three individual and complementary projects: the Dark Energy Camera Legacy Survey (DECaLS; Proposal ID #2014B-0404; PIs: David Schlegel and Arjun Dey), the Beijing-Arizona Sky Survey (BASS; NOAO Prop. ID #2015A-0801; PIs: Zhou Xu and Xiaohui Fan), and the Mayall z-band Legacy Survey (MzLS; Prop. ID #2016A-0453; PI: Arjun Dey). DECaLS, BASS and MzLS together include data obtained, respectively, at the Blanco telescope, Cerro Tololo Inter-American Observatory, NSF's NOIRLab; the Bok telescope, Steward Observatory, University of Arizona; and the Mayall telescope, Kitt Peak National Observatory, NOIRLab. Pipeline processing and analyses of the data were supported by NOIRLab and the Lawrence Berkeley National Laboratory (LBNL). The Legacy Surveys project is honored to be permitted to conduct astronomical research on Iolkam Du'ag (Kitt Peak), a mountain with particular significance to the Tohono O'odham Nation.

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## DATA AVAILABILITY

MGCLS products are publicly available (<https://doi.org/10.48479/7epd-w356>). Reprocessed products created as part of this work are available on reasonable request from the authors.

## REFERENCES

- Abbott T. M. C., et al., 2021, *The Astrophysical Journal Supplement Series*, 255, 20
- Astropy Collaboration et al., 2013, *A&A*, 558, A33
- Astropy Collaboration et al., 2018, *AJ*, 156, 123
- Astropy Collaboration et al., 2022, *apj*, 935, 167
- Banfield J. K., et al., 2015, *MNRAS*, 453, 2326
- Banfield J. K., et al., 2016, *MNRAS*, 460, 2376
- Becker R. H., White R. L., Helfand D. J., 1995, *ApJ*, 450, 559



- Boucaud A., Bocchio M., Abergel A., Orioux F., Dole H., Hadj-Youcef M. A., 2016, *A&A*, **596**, A63
- Bradski G., 2000, Dr. Dobb's Journal of Software Tools, **25**, 120
- Braun R., Bourke T., Green J. A., Keane E., Wagg J., 2015, in *Advancing Astrophysics with the Square Kilometre Array (AASKA14)*. p. 174
- Briggs D. S., 1995, PhD thesis, New Mexico Institute of Mining and Technology
- Buades A., Coll B., Morel J.-M., 2011, *Image Processing On Line*, **1**, 208
- Chon G., Böhringer H., Krause M., Trümper J., 2012, *A&A*, **545**, L3
- Cotton W. D., et al., 2022, *ApJ*, **934**, 78
- Dey A., et al., 2019, *AJ*, **157**, 168
- Dolag K., Böss L. M., Koribalski B. S., Steinwandel U. P., Valentini M., 2022, arXiv e-prints, p. [arXiv:2208.15003](https://arxiv.org/abs/2208.15003)
- Drlica-Wagner A., et al., 2018, *The Astrophysical Journal Supplement Series*, **235**, 33
- Fotopoulou S., et al., 2016, *A&A*, **587**, A142
- Galvin T. J., et al., 2020, *MNRAS*, **497**, 2730
- Gitti M., Feretti L., Schindler S., 2006, *A&A*, **448**, 853
- Gupta N., Huynh M., Norris R. P., Wang R., Hopkins A. M., Andernach H., Koribalski B. S., Galvin T. J., 2022, arXiv e-prints, p. [arXiv:2208.13997](https://arxiv.org/abs/2208.13997)
- Heywood I., 2020, oxkat: Semi-automated imaging of MeerKAT observations, Astrophysics Source Code Library, record ascl:2009.003 (ascl:2009.003)
- Heywood I., et al., 2022, *MNRAS*, **509**, 2150
- Hotan A. W., et al., 2021, *Publ. Astron. Soc. Australia*, **38**, e009
- Hugo B. V., Perkins S., Merry B., Mauch T., Smirnov O. M., 2022, in Ruiz J. E., Pierfederici F., Teuben P., eds, *Astronomical Society of the Pacific Conference Series Vol. 532, Astronomical Society of the Pacific Conference Series*. p. 541 ([arXiv:2206.09179](https://arxiv.org/abs/2206.09179))
- Hutschenreuter S., et al., 2022, *A&A*, **657**, A43
- Jarvis M., et al., 2016, in *MeerKAT Science: On the Pathway to the SKA*. p. 6 ([arXiv:1709.01901](https://arxiv.org/abs/1709.01901))
- Jonas J., MeerKAT Team 2016, in *MeerKAT Science: On the Pathway to the SKA*. p. 1
- Kenyon J. S., Smirnov O. M., Grobler T. L., Perkins S. J., 2018, *MNRAS*, **478**, 2399
- Knowles K., et al., 2022, *A&A*, **657**, A56
- Krause M. G. H., et al., 2019, *MNRAS*, **482**, 240
- Liu F. T., Ting K. M., Zhou Z., 2008, in *2008 Eighth IEEE International Conference on Data Mining*. pp 413–422, doi:[10.1109/ICDM.2008.17](https://doi.org/10.1109/ICDM.2008.17)
- Lochner M., Bassett B. A., 2021, *Astronomy and Computing*, **36**, 100481
- McMullin J. P., Waters B., Schiebel D., Young W., Golap K., 2007, in Shaw R. A., Hill F., Bell D. J., eds, *Astronomical Society of the Pacific Conference Series Vol. 376, Astronomical Data Analysis Software and Systems XVI*. p. 127
- Merritt D., Ekers R. D., 2002, *Science*, **297**, 1310
- Mohan N., Rafferty D., 2015, PyBDSF: Python Blob Detection and Source Finder, Astrophysics Source Code Library, record ascl:1502.007 (ascl:1502.007)
- Morganson E., et al., 2018, *Publications of the Astronomical Society of the Pacific*, **130**, 074501
- Mostert R. I. J., et al., 2021, *A&A*, **645**, A89
- Norris R. P., et al., 2021, *Publ. Astron. Soc. Australia*, **38**, e003
- Norris R. P., et al., 2022, *MNRAS*, **513**, 1300
- Oei M. S. S. L., et al., 2022, *A&A*, **660**, A2
- Offringa A. R., et al., 2014, *MNRAS*, **444**, 606
- Omar A., 2022, *MNRAS*, **516**, L43
- Planck Collaboration et al., 2020, *A&A*, **641**, A6
- Predehl P., et al., 2021, *A&A*, **647**, A1
- Segal G., Parkinson D., Norris R. P., Swan J., 2019, *PASP*, **131**, 108007
- Segal G., et al., 2022, arXiv e-prints, p. [arXiv:2206.14677](https://arxiv.org/abs/2206.14677)
- Sevilla-Noarbe I., et al., 2021, *The Astrophysical Journal Supplement Series*, **254**, 24
- Smirnov O. M., Tasse C., 2015, *MNRAS*, **449**, 2668
- Tasse C., et al., 2018, *A&A*, **611**, A87
- The Dark Energy Survey Collaboration 2005, arXiv e-prints, pp [astro-ph/0510346](https://arxiv.org/abs/astro-ph/0510346)
- Ubertosi F., et al., 2021, *ApJ*, **923**, L25
- Walmsley M., et al., 2022, *MNRAS*, **513**, 1581
- Webb S., et al., 2020, *Monthly Notices of the Royal Astronomical Society*, **498**, 3077–3094
- Wright E. L., et al., 2010, *AJ*, **140**, 1868
- Zhou R., et al., 2022, arXiv e-prints, p. [arXiv:2208.08515](https://arxiv.org/abs/2208.08515)
- van Haarlem M. P., et al., 2013, *A&A*, **556**, A2