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# Identifying recent captive escapees of Rainbow Lorikeets (*Trichoglossus moluccanus*) at different stages of the pet-release pathway

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**Introduction:** Rainbow Lorikeets (*Trichoglossus moluccanus*) are a highly desirable bird in Australian pet trade and consequently have established invasive populations outside their native range. These birds are aggressive, outcompete native species, and cause significant damage to agriculture. Invasive populations have not been impacted by existing management practices, and it is unclear if their persistence is due to their high reproductive success in the wild, or from regular escapes from captivity.

**Methods:** We tested the ability of stable isotope analysis to identify recently escaped captive Rainbow Lorikeets in wild populations within Australia. We compared the stable carbon ( $\delta^{13}$ C) and nitrogen ( $\delta^{15}$ N) isotopes of captive birds to three wild populations at different stages of the pet-release pathway: (i) birds within their native distribution; (ii) a newly established population; and (iii) a large invasive population.

**Results:** We found evidence of two escaped captive birds in the newly established population due to the higher and more variable  $\delta^{13}$ C, which is likely driven by the consumption of nectar supplements. The invasive population had a similar isotopic niche area to the native population; potentially indicating the invasive birds have adapted to the environment and learnt to consume a large variety of local food sources, therefore reducing the effectiveness of detecting recent escapees.

**Discussion:** Therefore, for contained wild populations with small isotopic niches, stable isotope analysis can be a useful tool to identify captive escapees and can inform management of invasive species incursions.

#### KEYWORDS

citizen science, Rainbow Lorikeets, pest management, pet birds, provenancing, SIBER, stable isotopes

## Introduction

The exotic pet trade facilitates a novel introduction pathway for new invasive alien populations to establish, which can lead to significant damage to environments and economies (Hulme, 2015; Lockwood et al., 2019; Bradshaw et al., 2021). Once an exotic pet is transported and sold outside its native range, it can be intentionally or unintentionally released from captivity, where they may survive and establish a wild population and spread (Cassey and Hogg, 2015; Vall-llosera and Cassey, 2017b; Toomes et al., 2022). Prevention and early management of potentially invasive species lowers the environmental and economic damages, while also increasing the likelihood of success and cost-effectiveness of eradication (Keller et al., 2007; Henderson et al., 2011).

The Rainbow Lorikeet (Trichoglossus moluccanus) is a highly charismatic Australian parrot species native to the east and southeastern coast of mainland Australia (Figure 1). Rainbow Lorikeets are also one of the most popular pet bird species (Vall-llosera and Cassey, 2017a; Chan et al., 2021; Hill et al., 2023), and as a consequence, have been introduced outside their native range in within Australia and internationally. These birds are intentionally or accidentally released from captivity and have species characteristics correlated with higher probabilities of escape, as well as being abundant in captivity and affordable in trade (Vallllosera and Cassey, 2017a; Chan et al., 2021; Hill et al., 2023). Escaped birds are particularly prevalent in urban areas, where a higher density of pet birds are kept (Shukuroglou and McCarthy, 2006; Vall-llosera and Cassey, 2017b; Stanley et al., 2023). Rainbow Lorikeets can readily adapt to new urban environments due to their nectivorous diet and can exploit the high proportion of nectar-rich plants (Davis et al., 2012). In addition to nectar, Rainbow Lorikeets have adapted to consume a wide variety of food sources, such as insects, seeds, flowers and fruits; however, their complete diet is relatively unknown (Cabana and Lee, 2019). Consequently, international pet trade has resulted in introduced populations in New Zealand (Polkanov and Greene, 2000) and Singapore (Neo, 2012). Domestic Australian trade has introduced populations outside their native range (Toomes et al., 2025) in Tasmania (Robinson et al., 2020), and are considered invasive in Western Australia (Chapman, 2005) where they compete with local species for hollows and food (Ambrose et al., 1990; Hingston, 2019a), hybridize with other native lorikeet species (Hingston, 2019b), and cause significant damage to agriculture, particularly to fruit crops (Bomford and Sinclair, 2002).

Tasmanian and Western Australian Rainbow Lorikeets represent two populations at different stages of the pet-release invasion pathway. In the recently established population in Tasmania, the first breeding pair outside of captivity was observed in 2007 (Robinson et al., 2020). Import of the species was banned in 2011; however, pet-keeping is still allowed for captive individuals imported before these restrictions (Wildlife Management Branch, 2017). Despite early and ongoing management efforts (i.e., culling), there are now three selfsustaining populations, each with an estimated maximum population size of approximately 500 individuals (Robinson et al., 2020). The invasive Western Australian population likely originated from a small number of captive releases around Perth in the 1960s (Long and Tingay, 1981; Coyle, 1988). This population rapidly expanded in size and range and is now the most observed bird in the State (Birdlife Australia, 2022) with an estimated 40,000 birds in 2018 (Pickering, 2018). While being a declared pest, they may still be kept as pets, providing opportunity for recent captive escapees to continue and contribute to their population growth (Wildlife Management Branch, 2017).

Despite the high risks of Rainbow Lorikeets to environments and economies, Rainbow Lorikeets are still legally traded in Australia in large numbers (Hill et al., 2023). Permits are required for keeping Rainbow Lorikeets in Western Australia and Tasmania (Wildlife Management Branch, 2017), which may reduce the number of birds sold (Toomes et al., 2022). However, these regulations do not prevent captive birds from escaping to potentially create, or contribute to existing, invasive populations. For example, the removal of individuals from invasive Tasmanian populations has been ineffective in controlling their population size (Cobden et al., 2021). For this Tasmanian population of Rainbow Lorikeets, it is unclear if recovery from management is due to their high fecundity, or from regular immigration from captivity.

Biosecurity efforts currently lack the technology to identify recent captive escapees rapidly and cost-effectively from a 'true' wild animal, which can assist with detecting invasive incursions in invasive populations. Here, we consider a "true wild animal" as either an individual that was born in the wild, or an individual that escaped from captivity and has survived and reproduced in the wild for some time, regardless of whether it is within its native range. Detection and monitoring of established populations often rely on surveys, which, without other early detection methods, may not identify an established population until it has grown to an unmanageable size (e.g., Robey et al., 2011; Tingley et al., 2015). Furthermore, understanding the proportion of captive escapees in an already established population can inform where management can be most effective to minimizing future risks. Specifically, if population growth is being aided by captive escapees, management efforts can focus on limiting pet ownership through stricter permit systems (Toomes et al., 2022) or through public education campaigns (e.g., the Habitattitude program; Reaser and Meyers 2007). While DNA methods such as pedigree testing may identify if an animal was bred in captivity (e.g., Frankham et al., 2015), this method can be resource-heavy, and does not apply for invasive populations which are recently descendant from captive escapees, such as Rainbow Lorikeets.

Stable isotope analysis (SIA) is an emerging tool in wildlife trade monitoring to determine captive and wild origins of wildlife (Prigge et al., 2025; Natusch et al., 2017; Ziegler et al., 2018; Andersson et al., 2021). However, its use in invasive species management is relatively unexplored (Brasileiro et al., 2023; Hill et al., 2020). As the stable isotope ratios in an animal's tissue are strongly related to its diet, SIA can provide a snapshot of an animal's dietary history, and thus its environmental origin (Kelly, 2000); especially considering that the diet of a wild and captive bird can vary dramatically. Stable



carbon isotope ratios ( $^{13}C/^{12}C$ , reported as  $\delta^{13}C$ ) vary significantly in relation to the plant material an animal consumes (Hobson and Clark, 1992), such as the proportion of C3 and C4 plants, plant water stress, marine and freshwater origins, and horticultural fertilizers (Hoefs, 2021). Nitrogen isotope ratios ( $^{15}N/^{14}N$ ,  $\delta^{15}N$ ) are partly influenced by an animal's trophic position (Post, 2002).  $\delta^{15}$ N varies due to a variety of processes related to nitrogen cycling between the atmosphere, soils, and water, and the subsequent assimilation by plants. These are likely to differ markedly between natural and agricultural plants, as well as between different plant types; notably N-fixing legumes and those that rely on the assimilation of nitrate. For captive Rainbow Lorikeets,  $\delta^{13}$ C and  $\delta^{15}$ N is likely further influenced by consumption of unique food sources not available to wild birds, such as nectar supplements (Cabana and Lee, 2019). SIA of a feather reflects the  $\delta^{13}$ C and  $\delta^{15}$ N composition of the bird's diet over the course of its growth and remains inert until molt, which for Rainbow Lorikeets is one year (Ambrose et al., 1990; Hobson and Wassenaar, 2018).

While the use of SIA to determine captive or wild origins has shown promise in parrot species (Alexander et al., 2019; Andersson et al., 2021), its efficacy is potentially reduced in species with generalist diets and large range sizes (Hill et al., 2025). Generalist species, and species with large range sizes, occupy larger isotopic niches (i.e., the range of stable isotope ratios within a population) (Bearhop et al., 2004), which may overlap with the diet of captive animals. This overlap in isotopic niche could be most pronounced when wild birds become urban adaptors and have access to food presumed to be only accessible to captive birds, such as household gardens, crops, or foraging in human food waste (Klump et al., 2021). Additionally, an invasive population is likely to increase its isotopic niche over time, as the birds adapt to their new environment and learn to access a wider range of food sources (Sol and Lefebvre, 2000). Nonetheless, the analysis of stable carbon and nitrogen isotopes on well-adapted, large invasive populations has yet to be explored and may assist in the management of relatively new invasive populations in restricted areas.

Here, we investigate the use of  $\delta^{13}$ C and  $\delta^{15}$ N analyses to detect recently escaped birds within three wild populations of Rainbow Lorikeets in Australia. We test the precision of this approach by measuring repeatability within an individual and compare the isotopic niche areas of captive Rainbow Lorikeets with three wild populations (i) within its native range, (ii) a newly established population, and (iii) a large invasive population. Finally, we apply these methods to estimate the proportion of potential captive escapees in each of the wild populations.

## **Methods**

## Sample collection

We collected feathers from Rainbow Lorikeets from four distinct populations in Australia: (i) birds kept in captivity (CAP); (ii) a native population in South Australia (natSA); (iii) a recently established and actively managed population in Tasmania (estTAS); and (iv) a widespread invasive population in Western Australia (invWA) (Figure 1).

For the CAP and natSA populations, we created a citizen science project to ensure we had feathers from a wide variety of locations and different aviaries and captive environments. We asked owners of captive parrots, aviaries, pet stores and zoos to collect naturally dropped feathers from their birds. Owners also provided the approximate age of their birds, to ensure we only included adults, as well as samples of nectar supplements often fed to their birds. Similarly, we asked participants to collect lorikeet feathers found in backyards from wild birds. These feathers were sent via post, labelled with the collection date and location, precise to postcode, and species was verified once received. As Rainbow Lorikeets molt over summer, feathers were collected over two summers from December 2020 to March 2022. All data on participants was collected according to established ethical standards for deidentifying personal data, and we received ethics approval from the University of Adelaide (HREC no. H-2020-184). See Hill et al. (2025) for more information on the citizen science project.

We received feathers from 18 captive individuals, predominantly from South Australia (n = 16), with additional samples from New South Wales (n = 1) and Queensland (n = 1). We hypothesized all captive birds to have similar diets and a smaller isotopic niche due to the similar commercial food products provided to captive birds. We also measured three brands of nectar supplements provided by owners (3 replicates per brand).

Furthermore, we selected a total of 33 natSA feathers collected through this program for analysis, by randomly selecting body feathers from each postcode to represent as wide a geographical area as possible within South Australia. When selecting feathers from similar locations, we used feathers collected from different times to minimize the chance of sampling the same individual. As we were unable to collect multiple feathers from the same wild individual, we also obtained feathers from two additional wild origin birds from the South Australian Museum collection to measure individual variation. As Rainbow Lorikeets within their native distribution are very well adapted to urban environments and can exploit a wide range of food sources (Veerman, 1991; Shukuroglou and McCarthy, 2006), we hypothesized their isotopic niche would be the largest of the wild populations. For the estTAS population, we measured feathers from 47 birds euthanized in management efforts collected from Kingston Beach, the southern-most established population, in June 2021. We hypothesized that this population, due to its relatively small geographic range and likely limited adaption to local food sources, would have a smaller isotopic niche in comparison to the widespread native and invasive populations.

For the invWA population, we measured feathers from 40 birds found in metropolitan Perth, which were sent to Native Animal Rescue and humanely euthanized according to the *Animal Welfare Act 2002* as pest animals, between January and August 2022. Due to how widespread this population is and the adaptability of Rainbow Lorikeets in urban environments, we hypothesized this population would have a highly varied diet and show a similarly large isotopic niche to the native population.

## Stable isotope analyses

Feathers were cleaned by washing with scientific-grade detergent ( $Decon^{\textcircled{0}}$  90) and water to remove surface contamination, and then repeatedly submerged in baths of 2:1 diethyl ether:methanol to remove lipids, following Bontempo et al. (2014). Feather vanes were separated from the rachis with sterile dissecting scissors and cut into small sections.

Random samples of each feather's vane were weighed accurately into tin capsules and sealed for analysis, using approximately 0.35 to 0.45mg to optimize readings. The samples were analyzed for  ${}^{13}C/{}^{12}C$  and  ${}^{15}N/{}^{14}N$  using a continuous flow isotope ratio mass spectrometer (Nu Horizon, Wrexham, UK) equipped with an elemental analyzer (EA3000, EuroVector, Pavia, Italy). Stable isotope ratios are expressed in  $\delta$  notation as deviations from a standard in parts per mil ( $\delta X$ ‰):

$$\delta X\% = \left(\frac{R_{sample}}{R_{standard}} - 1\right) \times 1000$$

Where  $R_{sample}$  is the atomic ratio of  ${}^{13}C/{}^{12}C$  or  ${}^{15}N/{}^{14}N$  in the sample, and  $R_{standard}$  is this ratio in the standard.  $\delta^{13}C$  was reported relative to the standard Vienna Pee Dee Belemnite (VPDB) and  $\delta^{15}N$  was reported relative to atmospheric N<sub>2</sub> (AIR). All samples were corrected for instrument drift and normalized according to reference values using in-house standards (n = 19);  $\delta^{13}C =$  glycine -31.2%, glutamic acid -16.72‰, and triphenylamine (TPA) -29.2‰; and  $\delta^{15}N =$  glycine 1.32‰, glutamic acid -6.18‰, and triphenylamine (TPA) -0.54‰. The in-house standards were calibrated against USGS and IAEA certified reference materials (USGS40, USGS 41, IAEA-2).

## Investigating sources of variation

As we included captive birds from a variety of locations, including different Australian States, we ensured the location of the feather did not significantly influence stable isotope ratios. We tested for spatial autocorrelation within body feathers from the CAP population using Moran's I (Legendre and Legendre, 2012).

It is common in wildlife management to only have access to body feathers, as is the case here for the invWA and estTAS populations. Therefore, we aimed to investigate if the choice of feather influenced the stable isotope ratios, and if repeat sampling was necessary to obtain accurate measures for individual birds. Here, we had four levels of sampling that could introduce variation: (i) between individuals (individual); (ii) between feather types (feather type); (iii) between feathers of the same type (feather replicate); and (iv) between replicates from the same feather (replicate). While this has been investigated in some depth in other birds (e.g., Grecian et al., 2015; Greer et al., 2015; Symes et al., 2017), Rainbow Lorikeets have highly variable diets and are locally nomadic, which may influence stable isotope ratios (Cannon, 1984; Ambrose et al., 1990; Klump et al., 2021). To investigate the variation within each level of sampling, we created a pilot dataset of five individual birds (three CAP and two natSA). From each bird, we measured  $\delta^{13}$ C and  $\delta^{15}$ N at three sampling levels: three feather types (body, primary wing, and tail); three feathers per feather type; and two replicates per feather.

To investigate differences between feather types, we used linear mixed effects models with and without feather type as a term, with the other levels of sampling (individual and feather replicate) as random effects. We compared these models with likelihood ratio tests and identified specific differences between feather types using Holm-Bonferroni corrected contrasts (Lenth, 2022; Bates et al., 2015). We then identified which level of sampling introduced the greatest proportion of variation by investigating the components of variation in these linear mixed effects models. To investigate the relative variability within each level of sampling, we calculated repeatability estimates (R), which determines the chance of obtaining the true stable isotope ratio of the population if only one sample of that level was taken (Choudhary and Nagaraja, 2017). Using the pilot dataset, we calculated R for each level using parametric bootstrapping, where linear model ignored the other levels of sampling to see how the relative variation changed (Stoffel et al., 2017). Estimates closer to 1 indicate higher repeatability, or low variation at that level.

Finally, we compared mean stable isotope values of all four populations (one captive and three wild) using separate linear mixed effects models for each of  $\delta^{13}$ C and  $\delta^{15}$ N, with individual and feather replicate as random intercepts and identified specific differences with Tukey HSD. We included the  $\delta^{13}$ C and  $\delta^{15}$ N means and standard deviations of the three captive nectar supplements to inspect the potential influence of different brands on the captive bird values visually.

## Comparing isotopic niches

To investigate variability in diets between the four populations, we quantified the area of isotopic niches: the range of values each population occupies in bivariate space (i.e.,  $\delta^{13}$ C and  $\delta^{15}$ N) using ellipses (estimated with the SIBER package in R; Jackson et al., 2011). To account for the potential variation introduced by multiple hierarchical levels of sampling, we aggregated the data to the mean

stable isotope ratio per bird (i.e., mean of 2 feather replicates per individual bird; see Supplementary Information 3 for non-aggregated results and dataset).

The calculation of the isotopic niche area with the Standard Ellipse Area (SEA) using the SIBER model assumes that the relationship between  $\delta^{13}$ C and  $\delta^{15}$ N is described by a multivariate normal distribution (Jackson et al., 2011). To evaluate this assumption, we examined if the data conformed to a multivariate normal distribution with tests of Mardia's multivariate skewness and kurtosis coefficients (Mardia, 1970). Where there was evidence that the assumption was not met, we modified the SIBER model to assume a multivariate Student's t-distribution for the  $\delta^{13}$ C- $\delta^{15}$ N variance-covariance relationship, which allows wider tails to the multivariate distribution thereby providing robust posterior estimates of the model parameters (Plummer, 2017). We again used Mardia's kurtosis coefficient and quantile-quantile plots against a theoretical multivariate t-distribution to assess conformation to the assumption (Kotz and Nadarajah, 2004; Supplementary Information 2). The SIBER analysis results presented were drawn from the model fitted using the multivariate variance distribution appropriate for the data.

To quantify isotopic niches, we used SIBER to fit multiple Bayesian standard ellipses for each population that allow betweenpopulation comparisons in the presence of uncertainty (Jackson et al., 2011). Posterior distributions of the isotope mean values and the covariance matrix parameters were calculated using Markov chain Monte Carlo (MCMC) by fitting a multivariate normal distribution to each of the populations independently with JAGS via the R package "rjags" (Plummer, 2022). Uninformative priors were used for the means of each isotope ratio ( $\mu = 0$  and  $\sigma^2 = 10^6$ ) and a Wishart prior was used for the covariance matrix ( $\rho = 2$ ; 2x2 scale matrix V with value two on the diagonal and zero on the offdiagonal) (Gelman et al., 2013). Where a multivariate t-distribution was required we generated robust estimates of the model parameters for each population by constructing the t-distribution from underlying normal and Gamma random variables (Plummer, 2017). To achieve this, we used the same uninformative priors as for the multivariate normal distribution described above with an additional prior for the degrees of freedom parameter of the tdistribution sampled from an exponential distribution with mean approximately equal to 30 (i.e., with degrees of freedom of 30 or greater the multivariate t converges to multivariate normal). The sampled degree of freedom value was used to specify the shape and rate parameters of the Gamma distribution (which in turn draws from the multivariate normal to produce a distribution with wider tails commensurate with lower degrees of freedom). Isotope values were *z*-score transformed prior to the analysis. We ran two MCMC chains for 40000 iterations each, discarded the first 1000 draws as burn-in, and thinned the resulting chains to retain every 10<sup>th</sup> iteration to remove autocorrelation (Jackson et al., 2011; Supplementary Information 2).

To compare sizes of isotopic niches, we calculated SEA corrected for small sample sizes (SEA<sub>C</sub>), which contains approximately 40% of the data, and identified the proportion of posterior distributions of one population which were larger than the other (Jackson et al., 2011). The resulting metrics are the permille

square area (‰<sup>2</sup>), and pairwise comparisons of the number of ellipses of one population which are larger than the other. We investigated the overlap in isotopic niches, to test if SIA can potentially identify captive escapees, by calculating means and standard deviations of Bayesian estimates for ellipse overlaps over 1000 draws.

In addition to examining the isotope niche area to measure overlap between captive and wild populations, we examined whether the populations could be classified in bivariate space using kernel discriminant analysis (Simonoff, 2012). This nonparametric classification method does not require the underlying distributions to be multivariate normal and allows for nonlinear classification contours (Mika et al., 1999). We performed the kernel discriminant analysis with R package ks (version 1.13.5; Duong, 2022), using multivariate kernel density estimation, and the plug-in estimator to calculate the optimal bandwidth matrix. The misclassification rate (overall and within populations) was used to summarize model performance.

All analyses were conducted in the R 4.2.2 software environment for statistical and graphical computing (R Core Team, 2022). We calculated repeatability with "rptR" (version 0.9.22; Stoffel et al., 2017), linear mixed effects models with "lme4" (version 1.1-31; Bates et al., 2015), Moran's I with "ape" (version 5.8; Paradis and Schliep, 2019), model coefficients with "emmeans" (version 1.8.2; Lenth, 2022), isotopic niche ellipses with "SIBER" (version 2.1.6; Jackson et al., 2011), variance components with "mixedup" (version 0.4.0; Clark, 2023), Mardia's multivariate skewness and kurtosis coefficients with "MVT" (version 0.3-8; Osorio, 2023), and kernel discriminant analysis with "ks" (version 1.13.5; Duong, 2022).

## Results

#### Investigating sources of variation

We found no evidence of the location of captive birds affecting  $\delta^{13}$ C (Moran's *I* = 0.19, *P* = 0.08) or  $\delta^{15}$ N (Moran's *I* = 0.20, *P* = 0.06).

In the subset of five individual birds (3 CAP and 2 natSA), there were clear differences in  $\delta^{13}$ C between feather types ( $\chi^{22} = 15.2, p < 0.01$ ; Supplementary Information 1). Specifically, tail feathers had lower  $\delta^{13}$ C than body feathers ( $t_{28.4} = 3.6, p < 0.01$ ), and wing feathers ( $t_{27.7} = 3.9, p < 0.01$ ). There was no difference in  $\delta^{15}$ N between feathers ( $\chi^{22} = 5.5, p = 0.06$ ). As inclusion of tail feathers may increase individual variation, we excluded them from further analyses.

Once tail feathers were excluded from analysis, withinindividual repeatability was very high for  $\delta^{13}$ C (R = 0.94, p < 0.01), but low for  $\delta^{15}$ N (R = 0.75, p < 0.01). Feather type ( $\delta^{13}$ C: R = 0.95, p < 0.05;  $\delta^{15}$ N: R = 0.83, p < 0.01) and feather replicate ( $\delta^{13}$ C: R = 0.96, p < 0.01;  $\delta^{15}$ N: R = 0.90, p < 0.01) repeatability were similarly high. Most of this variation was explained by betweenindividual differences (94% total variation in  $\delta^{13}$ C, 74% in  $\delta^{15}$ N), followed by between-feather differences ( $\delta^{13}$ C: 3% and  $\delta^{15}$ N: 17%). Therefore, we determined that repeated sampling within each feather was not necessary, and body and primary wing feathers could be combined for analysis. However, for the estTAS and invWA populations, only body feathers were available, so the remaining analysis for these populations includes two body feathers per bird (i.e., two measures of each  $\delta^{13}$ C and  $\delta^{15}$ N per bird). Due to the nature of the citizen science collection of the CAP and natSA populations, most birds only had single feathers available, so only include one feather per bird.

## Comparing isotopic niches

The CAP population's body and wing feathers exhibited significantly higher  $\delta^{13}$ C values (mean ± SD: -21.8 ± 2.1‰) than all three wild populations: natSA (-23.2 ± 1.6‰; t<sub>133</sub> = 9.2, p < 0.01), estTAS (-23.5 ± 1.3‰; t<sub>124</sub> = 11.6, p < 0.01), and invWA (-22.5 ± 1.4‰; t<sub>125</sub> = 4.7, p < 0.01; Figure 2). While the CAP population also exhibited higher  $\delta^{15}$ N values (7.5 ± 5.8‰) than invWA (5.6 ± 3.9‰; t<sub>131</sub> = 11.6, p < 0.01), the values were similar to the natSA (8.3 ± 4.4‰; t<sub>131</sub> = -1.8, p = 0.3) and estTAS populations (7.3 ± 3.6‰; t<sub>131</sub> = 0.4, p = 1). The three nectar supplements showed large variability between brands, where two brands showed high  $\delta^{13}$ C in comparison to all lorikeet population means (-17.8 ± 0.6‰ and -20.6 ± 0.5‰), while one brand was very low (-24.6 ± 0.2‰).  $\delta^{15}$ N values were similarly varied between brands (5.2 ± 0.7‰, 1.5 ± 0.3‰ and 3.2 ± 0.4‰, respectively).

The CAP population had the largest isotopic niche (SEA<sub>C</sub> = 7.1‰<sup>2</sup>) of all populations, where 100% of posterior distributions were larger than those for the three wild populations. The natSA and invWA populations had similar isotopic niche sizes (SEA<sub>C</sub> =  $2.6‰^2$  and  $2.3‰^2$  respectively, where 66% of natSA posterior distributions were larger than invWA), and estTAS population was significantly smaller than all other populations (SEA<sub>C</sub> =  $0.7‰^2$ , 0%). The captive population's isotopic niche overlapped with the natSA (mean ± standard deviation =  $11.0 \pm 17.8\%$  of the area of the natSA mean posterior ellipse area overlapped with the CAP area), and invWA populations (31.3 ± 22.6%). There was minimal overlap with the estTAS population ( $1.6 \pm 8.3\%$ ).

We found that the kernel discriminant analysis showed high discriminant accuracy for estTAS (98% classified correctly, Table 1) and natSA (96%). While the overall classification accuracy for invWA was relatively high (84%), only 50% of the captive individuals were classified correctly, with a large overlap with the contours between the invWA and CAP populations (Figure 3).

While the kernel discriminant analysis contours for natSA, CAP, and invWA partitioned the populations into single groups, two individuals in the estTAS group had significantly higher  $\delta^{13}$ C values compared to the remaining population. While they were correctly classified as estTAS (Table 1), they were separated into a separate cluster contained within the CAP contours (Figure 3). Additionally, these two individuals have high within-individual variation in comparison to other estTAS individuals (Figure 2). Therefore, with this evidence combined, we conclude that these two individuals are likely recent captive escapees.



FIGURE 2

(A) individual means and standard deviations of stable isotope ratios of  $\delta^{13}$ C and  $\delta^{15}$ N of four populations of Rainbow Lorikeets, and the means and standard deviations of three brands of nectar supplements for captive birds (open black squares). Dotted lines indicate convex hull areas, and solid lines are standard ellipse areas. (B) Boxplot of calculated Standard Ellipse Area (SEA) for each population with maximum likelihood of the posterior mode (black point) and SEA<sub>C</sub> (red cross), and 55, 75, and 95% confidence intervals.

# Discussion

Stable isotope analysis is a potential tool for managing invasive populations that have originated from the pet trade; however, our results suggest their use is limited to relatively new introduced populations, potentially due to smaller population size, geographic range size, or more restricted diet. Due to the large isotopic niche of the captive Rainbow Lorikeet population, it is likely not possible to create a reference database of "wild" and "captive" populations; however, it may be possible to use  $\delta^{13}$ C to classify outliers in small, recently established populations such as in Tasmania.

In the Tasmanian population, which is still relatively well managed and contained, analysis of stable carbon and nitrogen isotopes in the body and primary wing feathers may still be an effective tool to identify captive escapees. Here we found that two of the 47 birds from the Tasmanian population were classified into a separate cluster due to their significantly higher  $\delta^{13}$ C values, and also sit within the captive isotopic niche. The small Tasmanian isotopic niche is very restricted in comparison to the other two wild populations, and such dramatic differences in  $\delta^{13}$ C suggest these birds consume a significantly different diet and are potential captive escapees. These two birds also have some of the highest individual variation, which emphasizes the importance of repeat sampling per individual to capture recent captive escapees. As the birds in the pilot analysis showed little variation between feathers of the same body type, this variation may be due to a large change in diet

True population		Classification		Tatal	
		Captive	Wild	Total	
natSA	Captive	16	2	18	
	Wild	0	33	33	96%
	Total	16	35	51	
estTAS	Captive	17	1	18	
	Wild	0	47	47	98%
	Total	17	48	65	
invWA	Captive	9	9	18	
	Wild	0	40	40	84%
	Total	9	49	58	

TABLE 1 Classification accuracy of the kernel discriminant analyses (Figure 3), using  $\delta^{13}$ C and  $\delta^{15}$ N to classify individual birds to their respective populations.

between the growth of the two feathers, such as a spatial change or a recent immigration from captivity into the wild. The population we sampled is the newest of the three populations and has minimal migration from the other wild populations (Cobden et al., 2021). Therefore, these outliers are more likely to be captive escapees. We therefore have relatively high confidence that two of the 47 Tasmanian birds we sampled are recent escapees from captivity.

The captive birds exhibited a large range of  $\delta^{13}$ C values, which may be influenced by access to a variety of different nectar sources. Here we assumed the variation in captive diets was primarily driven by different feeding regimes, such as the proportions of nectar supplements, seed, and fruits and vegetables, rather than the geographic location of the captive birds within Australia. Wild lorikeets rely on nectar and pollen from flowering plants, particularly C<sub>3</sub> eucalypts and cultivated non-native plants, which can contribute up to 95% of a bird's total diet (Waterhouse, 1997; Smith and Lill, 2008). Nectar and pollen are a key source of protein and carbohydrates in Rainbow Lorikeet diets (Frankel and Avram, 2001). However, such high volumes of nectar are difficult to provide in captive environments, so commercial nectar supplements are commonly used. While wild birds may have access to nectar supplements in bird feeders, they are likely uncommon as they are expensive in comparison to alternatives such as bird seed. Here, we found that two of the three brands of nectar supplements had comparatively high  $\delta^{13}$ C. The main ingredients in these brands are sugars sourced from refined sugar, sugar cane, a C<sub>4</sub> plant, which would result in higher  $\delta^{13}$ C in bird tissue compared to other C<sub>3</sub> nectar sources (Padovan et al., 2003). One of the measured nectar supplements had low  $\delta^{13}$ C, as the main ingredients were C<sub>3</sub> plants including wheat and oats. As these nectar supplements could be used to bait wild Rainbow Lorikeets for trapping efforts (Pest and Disease Information Service, 2021), we recommend further testing of supplements, and any feed tables used in baiting should use a C3based supplement low in  $\delta^{13}$ C values to avoid masking the effect of nectar supplements on recent escapees.

Due to the invasive Western Australian population possessing a similar isotopic niche size area to the native population, large overlap

with the captive population, and high misclassification of captive individuals in the discriminant analysis, our results suggest that stable carbon and nitrogen isotope analysis alone is not an effective tool to identify captive escapees in widespread invasive populations of Rainbow Lorikeets. The isotopic niche for the widespread and relatively unmanaged invasive population in Western Australia has a similar niche size to the native population in South Australia. This may be in part due to the geographic range of the three wild populations: the Tasmanian population is from a relatively restricted area (Robinson et al., 2020), compared to the South Australian and Western Australian populations which are spread across a large cities and into rural areas (Veerman, 1991; Pickering, 2018). Additionally, as evidenced by the large isotopic niche and overlap with the captive isotopic niche, the Western Australian population may have learnt to access food sources which are usually only available to captive birds, such as commercial bird food in bird feeders or backyard vegetable gardens, or from the presence of nitrogen-based fertilizers in agricultural crops available to both captive and wild birds (Moller et al., 2018).

To further improve the confidence of using stable isotope analysis to identify captive escapees in invasive populations, including potentially broadening the application to wellestablished populations with large isotopic niches, captive feeding trials may be useful to identify the sources of variability. For example, the assimilation of  $\delta^{13}$ C from nectar supplements and other captive food into the tissues may assist in explaining the large variation seen in the captive isotopic niche (Symes et al., 2017), or quantifying any potential differences introduced by different feeding behaviors between juveniles and adults (Alexander et al., 2019). In this research, we focused on sampling feathers as they can be noninvasively sampled from live birds without causing stress to the animal, which is an important if this tool is to be used on legallyowned pet birds. However, feathers reveal up to one year of the animal's history; therefore, the assimilation of carbon isotopes into tissues with longer time frames, such as bone or claws, could be calculated to provide longer snapshots of the animals' captive or wild origin (Hobson and Clark, 1992; Kays and Feranec, 2011).



Furthermore, while research on captive and wild origins has focused on carbon and nitrogen, the addition of other stable isotopes, such as hydrogen, oxygen, or sulphur, may improve classification accuracy between origins (Prigge et al., 2025).

Our results indicate that stable carbon and nitrogen isotopes in bird feathers can potentially be an effective tool in the management of Rainbow Lorikeets, and potentially other taxa, in newly established wild populations with limited range sizes or restricted diets. Rainbow Lorikeets are a highly adaptable species where their behavior in the wild, including their isotopic niches, can closely reflect diets in captivity. Our results confirm this and show that  $\delta^{13}$ C and  $\delta^{15}$ N do not discriminate recent captive escapees within native and invasive populations due to a large overlap in their isotopic niches. To improve the confidence of classification, a captive feeding trial could identify reasons for the high variability in captive individuals and quantify the influence of nectar supplements on  $\delta^{13}$ C in bird feathers to assist in the ongoing management of these highly invasive species.

## Data availability statement

The original contributions presented in the study are included in the article/Supplementary Material. Further inquiries can be directed to the corresponding author/s.

## **Ethics statement**

The studies involving humans were approved by University of Adelaide Human Research Ethics. The studies were conducted in accordance with the local legislation and institutional requirements. The participants provided their written informed consent to participate in this study. The requirement of ethical approval was waived by University of Adelaide Animal Ethics Committee for the studies involving animals because Used scavenged material (i.e. naturally dropped feathers), and euthanized animals from invasive species management programs. The studies were conducted in accordance with the local legislation and institutional requirements. Written informed consent was obtained from the owners for the participation of their animals in this study.

## Author contributions

KH: Conceptualization, Data curation, Formal analysis, Funding acquisition, Investigation, Methodology, Project administration, Visualization, Writing – original draft, Writing – review & editing. SD: Formal analysis, Methodology, Software, Visualization, Writing – original draft, Writing – review & editing. SR: Conceptualization, Data curation, Resources, Writing – original draft, Writing – review & editing. TH: Data curation, Resources, Writing – original draft, Writing – review & editing. JT: Resources, Supervision, Writing – original draft, Writing – review & editing. OS: Resources, Supervision, Writing – original draft, Writing – review & editing. PC: Resources, Supervision, Writing – original draft, Writing – review & editing.

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# **Conflict of interest**

The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

## Generative AI statement

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# Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fevo.2025.1517867/ full#supplementary-material

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