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## Effects of age and captivity on the social structure and migration survival of a critically endangered bird

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## 1 Effects of age and captivity on the social structure and

## 2 migration survival of a critically endangered bird

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### 19 Abstract

20 Reintroductions of threatened species is a conservation strategy utilised around the world.

Unfortunately, many translocated individuals have poor rates of survival post-release. If released individuals are unable to socially integrate into wild populations, they might lose the safety of the group or fail to learn critical skills. We examined the effects of age and captivity on sociality and migration survival for the critically endangered orange-bellied parrot (Neophema chrysogaster). As part of recovery efforts, adult birds are released in spring to contribute to breeding and juveniles are released in autumn prior to migration. Historically, captive-bred adults have low rates of migration survival, whereas captive and wild juveniles survive at comparable rates. We investigated both the long-term impacts of captivity on sociality and how sociality impacted migration survival by constructing social networks and comparing captive and wild birds of different age classes. We found no differences between captive and wild birds, suggesting that released birds integrated into the population. However, juveniles were more strongly connected and demonstrated greater network stability than adults. While we found no impact of sociality on survival, our results provide evidence of different migration strategies previously described for juveniles and adults: adults depart in small groups, and juveniles depart as a larger flock a few weeks later. We suggest that the low migration survival of captive-bred adults may be attributable to this cohort missing the juvenile flocking phase. These results suggest that a juvenile developmental phase may be impactful in this species for future survival.

- **Keywords**: conservation translocation; social network; reintroduction; migration; juvenile; psittacine; survival; captive breeding
- 41 Short title: Social structure and survival
- **Word Count**: 4,673

#### Introduction

Translocating individuals has become an increasingly important conservation strategy for many threatened populations (IUCN/SSC, 2013), yet their post-release survival is often low (Fischer & Lindenmayer, 2000; Morris et al., 2021). Released animals need to learn to survive in the wild quickly, and failure to acquire necessary skills can lead to poor survival outcomes (Jule, Leaver, and Lea, 2008), thus hampering recovery efforts (Seddon, Armstrong, and Maloney, 2007). While a number of variables can contribute to poor postrelease survival, problems resulting from social behaviour have been identified as one of the key issues impacting translocation success (Berger-Tal, Blumstein, and Swaisgood, 2019), in part because the way animals interact can have carry-over consequences for other threats such as predation which has been documented to be a significant danger for many species (Fischer & Lindenmayer, 2000; White et al., 2012). For some species, successful integration into an existing group post-release has shown to be crucial for survival (Snyder et al., 1994), both for the safety provided by the group (Elgar, 1989) and learning important skills from wild conspecifics (Brakes et al., 2019). Once integrated into a group, translocated animals can learn critical survival skills and information from social interactions, including effective foraging strategies (Farine et al., 2015a; Thorogood, Kokko, and Mappes, 2018), predator recognition (Swift & Marzluff, 2015), and migration behaviours (Mueller et al., 2013). An individual's social position can therefore impact their ability to learn new skills (Boogert et al., 2008; Langley et al., 2018), receive important information (Boogert et al., 2014b), or to adapt to changing circumstances (Franks et al., 2020b), which creates carry-over effects on fitness via diminished survival (Langley et al., 2020) and/or reproduction (Schubert et al., 2007). For

example, Franks et al (2020b) demonstrated that juvenile hihi (Notiomystis cinctα) who gained more associates after translocation tended to have a higher rate of survival. Similarly, stable social relationships improved the reproductive success of female greater ani (Crotophaga major); females who maintained stable long-term associations fledged more chicks compared to females with less-stable social bonds(Riehl & Strong, 2018). Translocations inherently change the social structure of populations (Firth et al., 2017; Parker et al., 2012), so understanding how translocated individuals integrate into a population could help improve survival outcomes and recovery efforts (Brakes et al., 2021; Moseby *et al.*, 2020; Snijders *et al.*, 2017). The social structure of populations is especially important when considering the introduction of captive-bred animals. Captivity inherently presents a very different earlylife environment compared to the wild (Crates, Stojanovic, and Heinsohn, 2022; Mason et al., 2013), including reduced opportunities for social learning (Harrison et al., 2011; Spiezio et al., 2018). Furthermore, an individual's early life experience can affect social position within a population (Boogert, Farine, and Spencer, 2014a; Brandl et al., 2019). In this way, being born in captivity may disadvantage translocated animals if they cannot socially integrate with wild conspecifics post-release (Jule et al., 2008; VanderWerf et al., 2014; White *et al.*, 2012). Given that reintroductions of captive-bred animals are a globally important tool in the fight against extinction (IUCN/SSC, 2013), understanding the fitness consequences of social behaviour on reintroduction success is an important emerging aspect of conservation science (Goldenberg et al., 2019; Sosa et al., 2021). Social network analysis (SNA) has become a powerful tool that can reveal both the impacts of fine-scale social position on

individual fitness outcomes (Beck, Farine, and Kempenaers, 2021; Formica et al., 2012) or expose important underlying population structures which can impact survival or reproduction (Snijders et al., 2017). This can be particularly important for small populations that are more sensitive to the dramatic population changes caused by translocations (Firth et al., 2017; Parker et al., 2012; Snijders et al., 2017). Understanding the structure and importance of social groups can therefore help inform management decisions and release protocols to help improve the translocation success (Goldenberg et al., 2019): for example, black-tailed prairie dogs (Cynomys ludovicianus) were five times more likely to survive translocation when they were translocated in family groups (Shier, 2006), and Dunston et al. (2017) used SNA to demonstrate that captive-bred lions were able to form social structures comparable to wild prides. However, despite increasing recognition of the importance of social structure for conservation programmes (Brakes et al., 2021), (and the powerful tool offered by SNA), there remain few examples using this approach to explore the relationships between release protocols, social structure, and consequences for reintroduced animals.

We investigate the relationship between captivity, social position, and survival using a model species subject to an intensive reintroduction program. The critically endangered orange-bellied parrot (*Neophema chrysogaster*) is a small parrot that breeds in remote southwestern Tasmania during the austral spring/summer and migrates each winter to the Australian mainland before returning to the breeding grounds in spring (Birdlife International, 2018a; Brown & Wilson, 1981). As part of ongoing recovery efforts, captive-bred adults are released each austral spring with the aim of maximising the number of nests initiated in the wild (DELWP, 2016). In recent years, the recovery program has also trialled releasing captive-bred juveniles in the austral autumn prior to migration (Pritchard

et al., 2021). Little is known about orange-bellied parrot social structure, but parrots as a group are extremely social (Heinsohn, Buchanan, and Joseph, 2018), and juvenile orange-bellied parrots are known to form flocks prior to migration (Brown & Wilson, 1981). The threats driving the decline of orange-bellied parrots remain poorly defined and largely unmitigated but are suspected to include habitat loss, migration mortality, and Allee effects (Stojanovic et al., 2017; Stojanovic et al., 2020). Additionally, there is good evidence that first-migration survival of juvenile parrots has halved over the last two decades for unknown reasons (Stojanovic et al., 2020).

Adults survive the migration at a much higher rate than juveniles (approx. 58% compared to approx. 20%, (Stojanovic *et al.*, 2020)), suggesting that an individuals' first migration is more perilous than subsequent attempts. While the low rate of juvenile survival is limiting population growth (Stojanovic *et al.*, 2023), wild and captive juveniles are equally likely to survive their first migration attempt (Bussolini *et al.*, 2023a). However, , the migration survival probability of released captive-bred adults is reportedly very low (BirdLife Australia, 2020; Smales *et al.*, 2000) making this group much less likely to survive their first migration compared to both juveniles and wild adults. This is surprising because the majority of captive-bred adults released in spring have already survived several months in the wild, yet few go on to successfully complete the migration (BirdLife Australia, 2020; Smales *et al.*, 2000). The poor migration survival of released captive-bred adults is of conservation concern due to the extensive resources required to breed and release captive animals (Fischer & Lindenmayer, 2000).

Captivity can have long term impacts on social behaviour and position (Crates  $et\ al.$ , 2022; Goldenberg  $et\ al.$ , 2019) and sociality can impact individual survival in a number of ways

(Boogert *et al.*, 2014b; Franks *et al.*, 2020b; Langley *et al.*, 2018). If captive-bred adults are unable to socially integrate post-release, birds might be unable to form social bonds. This could increase mortality risks (if they are unable to benefit from the safety of the group) or impair their ability to learn information critical to migration success (including timing, migration routes, and stopover points).

Furthering our understanding of survival probabilities is arguably one of the most important factors facing orange-bellied parrot conservation, as poor survival outcomes (both of released adults and the low rates of juvenile survival) undermine recovery of this critically endangered species (Stojanovic *et al.*, 2023). If social behaviours contribute to poor migration outcomes for captive-bred adult parrots post-release, recovery programs can take steps to integrate this information into management practices, adjust release strategies, and help improve fitness outcomes of translocated populations (Dunston *et al.*, 2017; Goldenberg *et al.*, 2019).

Given the importance of social integration during early life on fitness, we hypothesise that the low survival of captive-bred adults arises from long-term impacts of an early life in captivity. If this is the case, we predict that released captive-bred adults would show differences in their sociality compared to both wild-living adults and juveniles, whereby less integration with a flock may result in an individual experiencing a lower number of social connections, being more peripheral in a group, and having more transient (and therefore variable) associations. In turn, social position could influence an individuals' probability of surviving its first migration. To determine if captivity has long-term impacts on orangebellied parrot social position we investigated: (i) differences in the number and strength of associations, (ii) position within the network, and (iii) stability of network position for

 different demographic cohorts. Finally, we investigated the consequences of sociality on individual migration survival outcomes. We discuss our findings in the context of management practices and reintroduction efforts that involve releases from captive populations.

#### **Materials and Methods**

#### **Background**

Study species & conservation actions

The critically endangered orange-bellied parrot is a small (~45 g) parrot endemic to southeastern Australia (Higgins, 1999). This species is an obligate migrant; birds breed in remote south-west Tasmania before migrating to the Australian mainland during the austral winter and returning the following spring (Brown & Wilson, 1981). Ongoing population decline has reduced the current breeding range to a single location at Melaleuca in Tasmania's southwest (DELWP, 2016). Birds return to the breeding grounds from late September, when they form monogamous pairs and begin nesting from mid-November – early December (Brown & Wilson, 1981). Juveniles fledge from late January – early March and stay with their parents for a few weeks before adults depart for migration (late January – early February); juveniles follow a few weeks later (BirdLife Australia, 2020) (Brown & Wilson, 1981). Birds are able to breed at approximately 9 months of age when they return to the breeding ground the following spring (BirdLife Australia, 2020).

The Tasmanian Government (NRE Tas) has facilitated an ongoing monitoring program of the wild orange-bellied parrot population at Melaleuca since the late 1970's (Smales et al.,

2000). Supplemental food is provided daily throughout the breeding season, and these feed

tables are monitored by volunteers each day from approximately September through to April (Troy & Lawrence, 2022). Thees monitoring data form the basis of both the social network and survival analyses.

A captive breeding program was first established for the orange-bellied parrot in 1986 (Smales *et al.*, 2000), and currently comprises several hundred birds across multiple institutions (Morrison *et al.*, 2020). In captivity, birds are generally housed in single-sex flocks until early spring when a single male and single female are paired for breeding (Bussolini *et al.*, 2023b). Breeding pairs are determined by a species coordinator to maximize genetic heterozygosity within the captive population (Bussolini *et al.*, 2023b; Morrison *et al.*, 2020). Juveniles are generally held with their family groups for several weeks post-fledging (BirdLife Australia, 2020).

As part of ongoing recovery efforts, captive-bred adult birds are released each spring to balance sex ratios and maximise breeding in the wild (DELWP, 2016). In recent years, captive-bred juveniles have been released in autumn just prior to migration (Pritchard *et al.*, 2021). Other management actions have involved 'head-starting' by capturing wild juveniles in autumn and holding them in captivity for several months before releasing them as adults the following spring (Pritchard *et al.*, 2021). At present, spring-releases of adult birds and autumn-releases of juveniles are ongoing management actions (Troy & Lawrence, 2022).

#### Available data

The long-term monitoring data gathered by volunteers and NRE Tas provide the basis for this analysis. Supplementary food is provided at three different locations and feed tables are monitored by volunteers for four hours each day (see map in Supplementary Materials). Individual birds are recorded as present or absent during 15-minute block increments

throughout the four-hour daily monitoring period. Only birds that land on the feed tables are recorded. Individual birds are identified via a unique colour leg-band combination (Troy & Lawrence, 2022).

Whist comprehensive and long-term, this dataset has some inherent limitations.

Specifically, there is no indication of the length of the visit per individual, and interactions are assumed (not necessarily observed) based on the occurrence of two individuals present in a given observation period. We assumed that individuals seen together in an observation period were associating in some way ('gambit-of-the-group' approach (Franks, Ruxton, and James, 2010)) as the population size is very small (17 birds returned from migration in 2016; (DELWP, 2016; Stojanovic *et al.*, 2020), and the existence of multiple feed tables means that individual parrots can choose where and when they feed, and thus with whom they associate. Additionally, there is a high degree of confidence (94%) regarding the identity and survival outcomes of each individual bird (Stojanovic *et al.*, 2020), so this dataset can

be considered an accurate representation of parrot social interactions in this context.

The population size of orange-bellied parrots available for detection at feed tables varies

over a breeding season due to staggered arrival from migration, initiation of nesting, incubation, provisioning, fledging, and migration departure; these fluctuations can result in the mean population size doubling during fledging, then halving as adults depart on migration (see Supplementary Materials). We therefore identified an six-week period in late summer (late-January to mid-March) when the population size was relatively stable as our focus for this study. This period captured both juveniles as they entered the population (early February – mid March) and adults before they departed on migration (late January – late February; (Brown & Wilson, 1981)). This length of time allowed us to incorporate a

large proportion of individuals while avoiding extreme changes in population size and preventing the network from getting too dense.

#### Network construction

We compiled feed table monitoring records from seven breeding seasons (2014/15 – 2020/21) and assembled group-by-individual matrices where all individuals recorded at the same location in the same 15-min window were assigned a unique group number. For (rare) instances of multiple unmarked individuals recorded in the same 15-min block that could not be distinguished by age or sex (2014, 2015) these observations were treated as one individual. We used the package 'asnipe' v. 1.1.16 (Farine, 2013) to build simple-ratio index weighted, undirected networks for each year which captured social interactions due to the high reliability of observing individuals in this population (Stojanovic *et al.*, 2020). All analysis was conducted in R v. 4.2.1 (R Core Team, 2023).

## Aim 1: Investigating differences in social metrics

#### Sociability of individual birds

To investigate differences in the sociability of individual birds, we used '*igraph*' v. 1.3.5 (Csardi & Nepusz, 2006) to calculate two different metrics of social connectivity. We first calculated a value of strength (defined as the sum of a link's weight in the weighted network (Sosa *et al.*, 2020)) for each individual. Strength is a reflection of both the frequency and number of an individual's interactions and can be considered a measure of an individuals' sociality (Sosa *et al.*, 2020). As population size varied across years, we standardized individual strength within each network. To do this, we ranked individuals by their strength value and then divided the rank by the size of the population that year, so that values were bound between o (least social) and 1 (most social).

We also calculated a value of eigenvector centrality which measures how centrally located an individual is within the network. Eigenvector centrality can be interpreted as the amount of social support or social capital an individual has (Sosa *et al.*, 2020). Values of eigenvector centrality range between o (least central) and 1 (most central) and were thus comparable between networks of different sizes (Castles *et al.*, 2014). While eigenvector centrality and measures of strength can be correlated (see Supplementary Materials) they account for slightly different aspects of the social environment (Sosa *et al.*, 2020), so we included both metrics.

#### Variation in network position through time

To investigate the degree of variation of an individual's social position over time, we expanded our original dataset to include eight weeks of observations (mid-Jan – mid-March). We chose to include additional weeks in order to maximise the number of birds present in multiple time-periods and increase the number of individuals that could be included in this analysis. A higher degree of variability in network position could reflect an ability to adapt and change associations more rapidly, which could be advantageous in a dynamic population as studies have shown that individuals with more adaptable social bonds do better in rapidly changing environments (Franks *et al.*, 2020b).

For each week in each year, we built simple-ratio index weighted, undirected networks using 'asnipe' v. 1.1.16 (Farine, 2013) and calculated a value of strength for each individual within each network with 'igraph' v. 1.3.5 (Csardi & Nepusz, 2006). Within each network we ranked individuals by their strength value. We then divided the rank by the size of the population in a given week, so that values were bound between o (least social) and 1 (most social). We calculated a coefficient of variation (CV) for each individual by dividing the

standard deviation of an individual's standardised rank by the mean, following methodology outlined in Murphy *et al.* (2019). A lower coefficient of variation indicates less variation in an individual's network position through time, while a higher coefficient of variation indicates greater variability. For individual birds that appeared across multiple years, a distinct CV value was calculated for each year.

#### Data analysis – social metrics

To explore how different aspects of translocation protocol linked to our three individuallevel social network metrics, we then fit a series of models for each standardised ranked strength, eigenvector centrality, and individual CV. We used generalised linear mixed effect models using a logit-link function and a beta distribution for both standardised ranked strength and eigenvector centrality, and used linear mixed effect models for individual CV using 'glmmTMB' v. 1.1.3 (Brooks et al., 2017). We fitted as fixed effects: provenance ('wild' or 'captive'); sex ('male', 'female', or 'unknown', determined by molecular techniques (Troy & Lawrence, 2022)); age class ('adult' or 'juvenile'); how the individual entered the population in a given year ('arrived from migration' or 'released from captivity'), hereafter referred to as 'release status'. We also included a three-way interaction of provenance × age class × release status to derive an estimate for each demographic cohort of interest resulting from various management actions over the timeframe of the study, and investigate the full ecological framework for this species. This three-way interaction produced six distinct demographic cohorts: four adult cohorts (wild and captive adults who had arrived from migration or had been released in spring); and two cohorts of juveniles (wild and captive; please see Supplementary Materials for a full description of each cohort). All models included the mean-centred number of observations of each individual as a fixed

effect to ensure variation was not due to differences in detection (Franks et al., 2020a). Year and individual ID were included as random effects in all models to account for repeated observations of the same individual. For standardised ranked strength and eigenvector centrality, we excluded individuals with fewer than three observations (n = 39) and unknown sex (n = 5). For individual CV, we excluded individuals of unknown sex (n = 7), or individuals seen in less than two time periods (n = 55). Model selection was based on ΔAIC >2 (Burnham & Anderson, 2002), and we evaluated model fit and verified assumptions with the 'check\_model' function in 'performance' v. o.9.1 (Lüdecke et al., 2021) and 'simulateResiduals' function in 'DHARMa' v. o.4.5 (Hartig, 2022). We calculated effect sizes using 'emmeans' v. 1.7.5 (Lenth, 2021), visualised results with 'gaplot2' v. 3.3.6 (Wickham, 2016), and used 'performance' v. 0.9.1 (Lüdecke et al., 2021) to calculate marginal and conditional and marginal R<sup>2</sup> values for all models. To account for the non-independent nature of social network data and following standard analysis procedure (Franks et al., 2020a; Weiss et al., 2021), we used the 'network\_swap' function in 'asnipe' v. 1.1.17 to create 1000 randomised networks each with 1000 node permutations (Farine, 2017; Farine, Whitehead, and Altizer, 2015b). We then generated the same social metrics from the randomised networks (eigenvector centrality, standardised ranked strength, and individual CV) and ran models with the same structures specified in the main methods section above. We then compared whether the test statistic from the

Assortment

As a way to determine if individuals freely socialised among the population or were

real data were significantly different to the values generated from the randomised

networks (see Supplementary Materials for details).

preferentially associating with members of the same demographic cohort, we used the package 'assortnet' v. o.1.2 (Farine, 2016) to calculate an assortativity coefficient (r) between demographic cohorts for each year following methodology outlined in Firth et al. (2015). Demographic cohorts were defined by an individual's provenance ('wild' or 'captive'), age class ('adult' or 'juvenile'), and release status ('arrived' or 'released'). Assortativity coefficients range from -1 to 1, where positive values indicate individuals preferentially associate with others in the same cohort, and negative values indicate avoidance. Assortativity analysis can reveal structure in the population that might not be detectable with social metrics alone (Newman, 2003). A high degree of assortment by demographic cohort could indicate that translocated or captive-bred birds are not integrating into the population and are preferentially associating with birds in the same cohort.

Assortativity coefficients calculated from the data were then compared against results from 10,000 randomised networks generated via node permutations sampled without replacement to account for non-independence of the network data (Firth & Sheldon, 2015; Franks *et al.*, 2020b).

# Aim 2: Investigating the impact of social metrics on first-migration survival

Finally, we investigated the impact of social metrics on first-migration survival rates. There is a body of evidence indicating that demographic variables (e.g., age, provenance) are likely to impact survival outcomes for orange-bellied parrots, with adults having a higher estimated rate of survival compared to juveniles, and captive-bred adults returning at low rates compared to other groups (BirdLife Australia, 2020; Smales *et al.*, 2000; Stojanovic *et* 

al., 2020). We therefore sought to first quantify variation in first-migration survival attributable to different demographic traits. To do this, we fitted generalised linear mixed effect models with a logit-link function and a binomial error distribution using 'glmmTMB' v. 1.1.3 (Brooks et al., 2017) with individual survival outcomes as a binomial response variable, and a three-way interactive term of provenance, age class, and release status as a fixed effect. Year was added as a random effect. Again we fit this three-way interaction - to estimate effects for each demographic cohort of interest relative to conservation actions taken for this species.

Recapture probability in this species is very high (Stojanovic *et al.*, 2020), thus we had a high degree of confidence that all survivors would be detected in the year after their first migration. We chose to focus on first-migration survival both due to the decrease in juvenile survival rates in recent years (Stojanovic *et al.*, 2020), and to prevent individuals from appearing in the data repeatedly. This therefore excluded birds that had completed the migration previously (adult birds with a release status of 'arrived') and reduced the number of demographic cohorts to four (wild and captive adults who were released in spring, and both wild and captive juveniles).

We then aimed to evaluate whether variance in sociability within demographic cohorts affected individual survival probabilities. To do this, we constructed three additional models with three different social metrics (standardized ranked strength, eigenvector centrality, and individual CV) as additional interactions to the three-way interactive model (e.g., provenance x age class x release status x standardized ranked strength, and so on). All models included the mean-centred number of observations of each individual as a fixed effect (Franks *et al.*, 2020a) and year as a random effect. Model selection was as stated

above using AIC model selection).

#### **Results**

#### *Investigating differences in social metrics*

#### Sociality of individual birds

We compiled 590 records of both standardized ranked strength and eigenvector centrality for 439 unique individuals over the seven seasons. The population size within each network ranged from a low of 37 birds in the 2015/16 season to a high of 206 individuals in the 2020/21 season.

For both standardised ranked strength and eigenvector centrality, the best model based on AIC selection included the three-way interactive term of provenance, age class, and release status (Table 1). For eigenvector centrality, all adults had lower estimates compared to both juvenile cohorts (Figure 1; full model estimates are provided in Supplementary Materials), and there was no difference in the estimates between any of the four adult cohorts (captive-arrived, wild-arrived, captive-released, wild-released). Captive-juveniles had similar but slightly higher estimates of both social metrics compared to wild juveniles. This relationship between age, provenance and release status and social metric was robust following permutations, as cohort estimates differed from those generated by randomised networks (Supplementary Figure S1). While the model for standardised ranked strength indicated similar age-provenance-release status patterns, the model permutations suggested this was not statistically robust. Estimates for both classes of juveniles, and for wild-arrived adults, did not differ from random chance; instead, only captive-arrived, captive-released, and wild-released adults had statistically robust estimates

(Supplementary Figure S2).

#### Variation in network position through time

A total of 594 values of coefficient of variation (CV) were calculated, comprising 449 different individuals across seven seasons. When individual CV was fitted as a response variable, the best supported model based on AIC selection included the single term of age class (Table 1). There was a small but significant difference in network variation between adults and juveniles, with adults having a higher coefficient of variation, and thus a greater degree of variation in social position and connections through time compared to juveniles (Figure 1, full model estimates are provided in Supplementary Materials). Conversely, juveniles were more stable in their social connections and positions through time.

Reflecting these patterns in consistency, model estimates for the effect of adults on CV did not differ from those expected by random chance generated by permutations, while juveniles were significantly different to random (Supplementary Figure S3).

#### Assortment

Orange-bellied parrots showed strong positive assortment by demographic cohort, indicating that associations were strongest between members of the same cohort, and weakest between members of different cohorts (Figure 2). Assortativity coefficients were positive (range: 0.08 – 0.22) for every year and fell well outside the 95% range generated by random permutations of the dataset (Figure 2). This suggests that orange-bellied parrots primarily associate with individuals of the same age class, release status, and provenance as themselves. Mixing matrices for each year are presented in Supplemental Materials.

#### Impact of social metrics on survival

A total of 396 individuals had suitable social data to be included in our analysis of first-migration survival. The best supported model for first-migration survival only included the three-way interactive term of provenance, age class, and release status (Table 1). When social metrics (standardised ranked strength, eigenvector centrality, and individual CV) were added as an additional interactive term, social metrics did not improve model fit based on AIC values (Table 1). This suggests that within each demographic cohort, individuals were equally likely to survive regardless of their sociality, network position, or level of variability in social interactions.

Wild adults released in spring had the highest probability of surviving their first migration (48%, CI: 26.1-70.8%), while released captive adults had the lowest (11.5%, CI: 5.8 – 21.5%). Captive and wild juveniles survived at similar rates consistent with other estimates of juvenile survival (26.6%, CI:19.5% - 35.1% and 34.3%, CI: 27.8% - 41.5% respectively).

#### **Discussion**

Our study aimed to map the social structure of orange-bellied parrots to investigate potential long-term impacts of both age and captivity on social position and first-migration survival. We reveal key social differences between adults and juveniles. Juvenile orange-bellied parrots are more centrally located in the network (higher eigenvector centrality), and more stable in their network position through time (lower CV) (Figure 1), in comparison to the less consistent adult social connections.

This highly social behaviour of juveniles could reflect known descriptions of orange-bellied parrot life history. After breeding, adult birds depart on the migration first in staggered

groups, leaving juveniles to flock together before they also leave a few weeks later (Brown & Wilson, 1980; Brown & Wilson, 1981). The higher eigenvector centrality, and network stability seen in juveniles, in addition to the high degree of assortment in the population, likely reflects this flocking behaviour, whereas the higher CV, and lower eigenvector centrality could reflect the adult birds already having departed on migration. Furthermore, we detected less robust effects from standardised ranked strength (an individual's relative number of associates) in comparison to eigenvector centrality (encompassing both an individual's own *plus* its neighbour's connectedness). This warrants further investigation over further years to probe variation in different network qualities further, but could reflect a differences in sociality from being in a highly connected juvenile flock compared to more transient adult associations.

The pre-migration juvenile flocking period could involve forming important social bonds and/or learning critical skills for migration as birds can learn migration skills from conspecifics (Mueller *et al.*, 2013). If this is the case, this could explain both the similar survival rates of captive and wild juveniles and the poor survival of captive adults. Captive adults might be disadvantaged because they missed a critical juvenile learning or socialisation period. The higher first-migration survival rates of wild birds released as adults (wild-adult-released) also support this theory. These birds fledged as juveniles in the wild for a few weeks before being caught and held in captivity over winter and released in spring as adults. Despite months in captivity, these birds have a much higher rate of first-migration survival than captive-bred adults released at the same time of year, perhaps due to their early experience flocking with other juveniles. There is evidence that social disruption early in life can have profound and long-term consequences for a variety of species (Shannon *et al.*, 2013) (Brandl *et al.*, 2019; Turner *et al.*, 2021), which could

potentially help explain the low migration success of captive-bred adults.

Alternatively, this period of juveniles flocking prior to migration could be about finding safety in numbers rather than learning migration skills, since more experienced adult birds have already departed on migration. Observations of migrating orange-bellied parrots by Brown and Wilson (1980) describe juveniles consistently being seen in large groups, while adult birds were usually seen in pairs or small groups. These descriptions, coupled with our findings, suggest that juvenile orange-bellied parrots form 'gangs' similar to those described in ravens (*Corvus corax*) (Dall & Wright, 2009) and hihi (*Notiomystis cincta*) (Franks et al., 2020c). Juvenile lead gangs can act as information centres and provide evolutionary advantageous foraging strategies, search efficiency, and social opportunities (Dall & Wright, 2009; Wright, Stone, and Brown, 2003). While neither ravens nor hihi migrate, age-dependent migration strategies have been observed in several species of bird; juveniles often exhibit different migration behaviours and delayed departure dates compared to adults (McKinnon et al., 2014; Verhoeven et al., 2022) and continually adjust their migration behaviours as they age (Sergio et al., 2014; Verhoeven et al., 2022). The patterns seen in orange-bellied parrots suggest that juveniles in highly-connected social gangs prior to migration may be advantaged. Declining survival rates in this cohort may in part be due to the historically small group sizes departing on migration and related component Allee effects (Crates et al., 2017; Stojanovic et al., 2020). Captive adults released in spring exhibit very similar social behaviours to other adult cohorts, and survival differences appear unrelated to the social traits we measured. Research into other migratory species suggests captive-bred individuals exhibit different migration behaviours when compared to wild birds, which could be a result of genetic

differences, limited physical fitness, or ignorance about appropriate migration routes (Burnside, Collar, and Dolman, 2017; Villers *et al.*, 2010). The wild and captive populations of orange-bellied parrots are genetically similar (Morrison *et al.*, 2020), and while there are some morphological differences between captive and wild birds (Bussolini *et al.*, 2023a; Stojanovic *et al.*, 2021), released adults presumably develop enough physical fitness as they have been living in the wild for several months. Alternatively, released birds could be overly reliant on supplemental food, or be unable to recognise wild food plants on migration (BirdLife Australia, 2020). Very little is known about migration of this species, so it is impossible to say what factors are contributing to the low survival of released birds without targeted research along the migration route (Stojanovic *et al.*, 2020).

Our study did not reveal any impacts of social position on survival rates within demographic

cohorts. This suggests that within each cohort, individuals are equally likely to survive regardless of their sociality, centrality, or network stability. However, our study has some inherent limitations: in addition to a very small population, these observational data are relatively coarse, and survival rates are so low that only a handful of individuals return in any given year (Stojanovic *et al.*, 2017). Additionally, this survival analysis only comprises a subset of individuals captured by the SNA and is not necessarily reflective of the entire population. Therefore, we cannot discount the concept of information transmission or social position impacting survival outcomes, but this was not detectable in this study, potentially due to a lack of statistical power in the four-way interactions. Although first-migration survival of captive-bred adult birds is low, captive-bred juveniles survive at similar rates to wild birds, and captive-bred adults seem to adjust their behaviours to match wild birds after release. The captive population could provide opportunities to further investigate the idea of learning and information transmission in juvenile parrots, thus

better equipping birds released as adults.

As more species are threatened with extinction (BirdLife International, 2018b; Lees et al., 2022; Rosenberg et al., 2019), conservation breeding programs will continue to be a critical tool for recovery programs worldwide (IUCN/SSC, 2013). Our research demonstrates that captivity does not necessarily impact sociality, but shows that captive-bred adults have much poorer survival outcomes compared to birds released as juveniles. This could imply some sort of critical learning period with significant carry over effects on fitness. These findings highlight the need to investigate the impacts of different management strategies on post-release and first-migration survival. The equivalent migration survival rates of captive and wild juveniles (Bussolini et al., 2023a) support the idea that releasing juveniles is a viable strategy for supporting long-term population growth in this species compared with releasing captive-bred adults (Pritchard et al., 2021; Stojanovic et al., 2023). However, the contribution of released captive-bred adults has been crucial to preventing the extinction of this species by increasing breeding in the wild (Stojanovic et al., 2020). Managers must balance the risks and benefits of both management strategies (Stojanovic et al., 2023). Overall, captivity can impact both social behaviour and individual fitness, and this information can help recovery programs improve post-release survival and grow threatened populations. We have demonstrated how social network analysis can be applied in complex reintroductions scenarios to understand the consequences of social interactions when animals in the population originate from multiple sources and across years. While social metrics did not impact first-migration survival for orange-bellied parrots, differences in social interactions may still have the potential to impact longer-term measures of reintroduction success and thus still warrants further exploration in future.

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#### References

- Beck, K. B., Farine, D. R. & Kempenaers, B. (2021). Social network position predicts male mating success in a small passerine. *Behavioral ecology* 32, 856.
- Berger-Tal, O., Blumstein, D. T. & Swaisgood, R. R. (2019). Conservation translocations: a review of common difficulties and promising directions. *Animal Conservation* 23, 121.
- BirdLife Australia (2020). A stocktake of recovery activities undertaken for the Orangebellied Parrot (*Neophema chrysogaster*). BirdLife Australia (Ed.): Department of the Environment and Energy.
- Birdlife International (2018a). *Neophema chrysogaster*. In *The IUCN Red List of Threatened Species 2018: eT22685203A130894893*). 13 July 2021. 10.2305/IUCN.UK.2018-2.RLTS.T22685203A130894893.en.
- BirdLife International (2018b). State of the world's birds: taking the pulse of the planet. Allinson, T. (Ed.). Cambridge, UK: BirdLife International.
- Boogert, N. J., Farine, D. R. & Spencer, K. A. (2014a). Developmental stress predicts social network position. *Biology Letters* 10, 20140561.
- Boogert, N. J., Nightingale, G. F., Hoppitt, W. & Laland, K. N. (2014b). Perching but not foraging networks predict the spread of novel foraging skills in starlings. *Behavioural processes* 109 Pt B, 135.
- Boogert, N. J., Reader, S. M., Hoppitt, W. & Laland, K. N. (2008). The origin and spread of innovations in starlings. *Animal Behaviour* 75, 1509.
- Brakes, P., Carroll, E. L., Dall, S. R. X., Keith, S. A., McGregor, P. K., Mesnick, S. L., Noad, M. J., Rendell, L., Robbins, M. M., Rutz, C., Thornton, A., Whiten, A., Whiting, M. J., Aplin, L. M., Bearhop, S., Ciucci, P., Fishlock, V., Ford, J. K. B., Notarbartolo di Sciara, G., Simmonds, M. P., Spina, F., Wade, P. R., Whitehead, H., Williams, J. & Garland, E. C. (2021). A deepening understanding of animal culture suggests lessons for conservation. *Proceedings of the Royal Society of London. Series B: Biological Sciences* 288, 20202718.
- Brakes, P., Dall, S. R. X., Aplin, L. M., Bearhop, S., Carroll, E. L., Ciucci, P., Fishlock, V. c., Ford, J. K. B., Garland, E. C., Keith, S. A., McGregor, P. K., Mesnick, S. L., Noad, M. J., Sciara, G. N. d., Robbins, M. M., Sinunonds, M. P., Spina, F., Thornton, A., Wade, P. R., Whiting, M. J., Williams, J., Rendell, L., Whitehead, H., Whiten, A. & Rutz, C. (2019). Animal cultures matter for conservation: Understanding the rich social lives of animals benefits international conservation efforts. *Science (American Association for the Advancement of Science)* 363, 1032.
- Brandl, H. B., Farine, D. R., Funghi, C., Schuett, W. & Griffith, S. C. (2019). Early-life social environment predicts social network position in wild zebra finches. *Proceedings of the Royal Society of London. Series B: Biological Sciences* 286, 20182579.
- Brooks, M. E., Kristensen, K., van Benthem, K. J., Magnusson, A., Berg, C. W., Nielsen, A., Skaug, H. J., Maechler, M. & Bolker, B. M. (2017). glmmTMB Balances speed and flexibility among packages for zero-inflated generalized linear mixed modeling. *The R Journal* 9, 378.
- Brown, P. B. & Wilson, R. I. (1980). A survey of the orange-bellied parrot (*Neophema chrysogaster*) in Tasmania, Victoria, and South Australia.): World Wildlife Fund.
- Brown, P. B. & Wilson, R. I. (1981). A survey of the orange-bellied parrot (Neophema

- chyrsogaster) in Tasmania, Victoria, and South Australia.): World Wildlife Fund.
- Burnham, K. P. & Anderson, D. R. (2002). *Model selection and multimodel inference: a practical information-theoretic approach*. 2nd edn. New York: Springer.
- Burnside, R. J., Collar, N. J. & Dolman, P. M. (2017). Comparative migration strategies of wild and captive-bred Asian Houbara *Chlamydotis macqueenii*. *Ibis* 159, 374.
- Bussolini, L. T., Crates, R., Herrod, A., Magrath, M. J. L., Troy, S. & Stojanovic, D. (2023a). Carry-over effects of nestling physical condition predict first-year survival of a critically endangered migratory parrot. *Animal Conservation*.
- Bussolini, L. T., Crates, R., Magrath, M. J. L. & Stojanovic, D. (2023b). Identifying factors affecting captive breeding success in a critically endangered species. *Emu Austral Ornithology* 123, 161.
- Castles, M., Heinsohn, R., Marshall, H. H., Lee, A. E. G., Cowlishaw, G. & Carter, A. J. (2014). Social networks created with different techniques are not comparable. *Animal Behaviour* 96, 59.
- Crates, R., Rayner, L., Stojanovic, D., Webb, M. & Heinsohn, R. (2017). Undetected Allee effects in Australia's threatened birds: implications for conservation. *Emu Austral Ornithology* 117, 207.
- Crates, R., Stojanovic, D. & Heinsohn, R. (2022). The phenotypic costs of captivity. *Biological Reviews*.
- Csardi, G. & Nepusz, T. (2006). The igraph software package for complex network research. InterJournal, 1695.
- Dall, S. R. & Wright, J. (2009). Rich pickings near large communal roosts favor 'gang' foraging by juvenile common ravens, *Corvus corax*. *PloS one* 4, e4530.
- DELWP (2016). National recovery plan for the Orange-bellied Parrot *Neophema* chrysogaster. Pritchard, R. (Ed.). Canberra, Australia: Department of Enviornment Land Water and Planning.
- Dunston, E. J., Abell, J., Doyle, R. E., Kirk, J., Hilley, V. B., Forsyth, A., Jenkins, E. & Freire, R. (2017). An assessment of African lion *Panthera leo* sociality via social network analysis: prerelease monitoring for an ex situ reintroduction program. *Current zoology* 63, 301.
- Elgar, M. A. (1989). Predator vigilance and group size in mammals and birds: a critical review of the empirical evidence. *Biological Reviews* 64, 13.
- Farine, D. R. (2013). Animal Social Network Inference and Permutations for Ecologists in R using asnipe. *Methods in Ecology and Evolution* 4, 1187.
- Farine, D. R. (2016). assortnet: Calculate the assortativity coefficient of weighted and binary networks. *R Package*. version 0.1.2.
- Farine, D. R. (2017). A guide to null models for animal social network analysis. *Methods in Ecology and Evolution* 8, 1309.
- Farine, D. R., Aplin, L. M., Sheldon, B. C. & Hoppitt, W. (2015a). Interspecific social networks promote information transmission in wild songbirds. *Proceedings of the Royal Society of London. Series B: Biological Sciences* 282, 20142804.
- Farine, D. R., Whitehead, H. & Altizer, S. (2015b). Constructing, conducting and interpreting animal social network analysis. *The Journal of animal ecology* 84, 1144.
- Firth, J. A. & Sheldon, B. C. (2015). Experimental manipulation of avian social structure reveals segregation is carried over across contexts. *Proceedings of the Royal Society of London. Series B: Biological Sciences* 282.
- Firth, J. A., Voelkl, B., Crates, R. A., Aplin, L. M., Biro, D., Croft, D. P. & Sheldon, B. C.

66o

68o

- (2017). Wild birds respond to flockmate loss by increasing their social network
   associations to others. *Proceedings of the Royal Society of London. Series B: Biological Sciences* 284, 20170299.
  - Fischer, J. & Lindenmayer, D. B. (2000). An assessment of the published results of animal relocations. *Biological Conservation* 96, 1.
  - Formica, V. A., Wood, C. W., Larsen, W. B., Butterfield, R. E., Augat, M. E., Hougen, H. Y. & Brodie, E. D., 3rd (2012). Fitness consequences of social network position in a wild population of forked fungus beetles (*Bolitotherus cornutus*). *Journal of Evolutionary Biology* 25, 130.
  - Franks, D. W., Ruxton, G. D. & James, R. (2010). Sampling animal association networks with the gambit of the group. *Behavioral Ecology and Sociobiology* 64, 493.
  - Franks, D. W., Weiss, M. N., Silk, M. J., Perryman, R. J. Y., Croft, D. P. & Graham, L. (2020a). Calculating effect sizes in animal social network analysis. *Methods in Ecology and Evolution* 12, 33.
  - Franks, V. R., Andrews, C. E., Ewen, J. G., McCready, M., Parker, K. A. & Thorogood, R. (2020b). Changes in social groups across reintroductions and effects on post-release survival. *Animal Conservation* 23, 443.
  - Franks, V. R., Ewen, J. G., McCready, M., Rowcliffe, J. M., Smith, D. & Thorogood, R. (2020c). Analysing age structure, residency and relatedness uncovers social network structure in aggregations of young birds. *Animal Behaviour* 166, 73.
  - Goldenberg, S. Z., Owen, M. A., Brown, J. L., Wittemyer, G., Oo, Z. M. & Leimgruber, P. (2019). Increasing conservation translocation success by building social functionality in released populations. *Global ecology and conservation* 18.
  - Harrison, X. A., Blount, J. D., Inger, R., Norris, D. R. & Bearhop, S. (2011). Carry-over effects as drivers of fitness differences in animals. *Journal of Animal Ecology* 80, 4.
  - Hartig, F. (2022). DHARMa: Residual diagnostics for hierarchical (multi-level/mixed) regression models. *R package*. version 0.4.5.
  - Heinsohn, R., Buchanan, K. L. & Joseph, L. (2018). Parrots move to centre stage in conservation and evolution. *Emu Austral Ornithology* 118, 1.
  - Higgins, P. J. (Ed.) (1999) *Handbook of Australian, New Zealand and Antarctic Birds. Volume 4: Parrots to Dollarbird,* Melbourne, Oxford University Press.
  - IUCN/SSC (2013). Guidelines for Reintroductions and Other Conservation Translocations.). Gland, Switzerland: IUCN Species Survival Commission.
  - Jule, K. R., Leaver, L. A. & Lea, S. E. G. (2008). The effects of captive experience on reintroduction survival in carnivores: A review and analysis. *Biological Conservation* 141, 355.
  - Langley, E. J. G., Horik, J. O., Whiteside, M. A., Beardsworth, C. E., Weiss, M. N., Madden, J. R. & Dingemanse, N. (2020). Early-life learning ability predicts adult social structure, with potential implications for fitness outcomes in the wild. *Journal of Animal Ecology* 89, 1340.
  - Langley, E. J. G., van Horik, J. O., Whiteside, M. A., Beardsworth, C. E. & Madden, J. R. (2018). The relationship between social rank and spatial learning in pheasants, *Phasianus colchicus*: cause or consequence? *PeerJ* 6, e5738.
  - Lees, A. C., Haskell, L., Allinson, T., Bezeng, S. B., Burfield, I. J., Renjifo, L. M., Rosenberg, K. V., Viswanathan, A. & Butchart, S. H. M. (2022). State of the World's Birds.

    Annual Review of Environment and Resources 47, 231.
  - Lenth, R. V. (2021). emmeans: Estimated marginal means, aka least-squares means. R

*package*. version 1.5.5-1.

- Lüdecke, D., Ben-Shachar, M. S., Patill, I., Waggoner, P. & Makowski, D. (2021). performance: An R package for Assessment, Comparison and Testing of Statistical Models. *Journal of Open Source Software* 6, 3139.
- Mason, G., Burn, C. C., Dallaire, J. A., Kroshko, J., McDonald Kinkaid, H. & Jeschke, J. M. (2013). Plastic animals in cages: behavioural flexibility and responses to captivity. *Animal Behaviour* 85, 1113.
- McKinnon, E. A., Fraser, K. C., Stanley, C. Q. & Stutchbury, B. J. (2014). Tracking from the tropics reveals behaviour of juvenile songbirds on their first spring migration. *PloS one* 9, e105605.
- Morris, S. D., Brook, B. W., Moseby, K. E. & Johnson, C. N. (2021). Factors affecting success of conservation translocations of terrestrial vertebrates: A global systematic review. *Global ecology and conservation* 28.
- Morrison, C. E., Johnson, R. N., Grueber, C. E. & Hogg, C. J. (2020). Genetic impacts of conservation management actions in a critically endangered parrot species. *Conservation Genetics* 21, 869.
- Moseby, K. E., Blumstein, D. T., Letnic, M. & West, R. (2020). Choice or opportunity: are post-release social groupings influenced by familiarity or reintroduction protocols? *Oryx* 54, 215.
- Mueller, T., O'Hara, R. B., Converse, S. J., Urbanek, R. P. & Fagan, W. F. (2013). Social Learning of Migratory Performance. *Science (American Association for the Advancement of Science)* 341, 999.
- Murphy, D., Mumby, H. S., Henley, M. D. & Griffin, A. (2019). Age differences in the temporal stability of a male African elephant (*Loxodonta africana*) social network. *Behavioral ecology*.
- Newman, M. E. J. (2003). Mixing patterns in networks. *Physical review. E, Statistical, nonlinear, and soft matter physics* 67, 026126.
- Parker, K. A., Anderson, M. J., Jenkins, P. F. & Brunton, D. H. (2012). The effects of translocation-induced isolation and fragmentation on the cultural evolution of bird song. *Ecology Letters* 15, 778.
- Pritchard, R. A., Kelly, E. L., Biggs, J. R., Everaardt, A. N., Loyn, R., Magrath, M. J. L., Menkhorst, P., Hogg, C. J. & Geary, W. L. (2021). Identifying cost-effective recovery actions for a critically endangered species. *Conservation Science and Practice* 4.
- R Core Team (2023). R: A language and environment for statistical computing. *R Foundation for Statistical Computing*. version 4.3.o.
- Riehl, C. & Strong, M. J. (2018). Stable social relationships between unrelated females increase individual fitness in a cooperative bird. *Proceedings of the Royal Society of London. Series B: Biological Sciences* 285.
- Rosenberg, K. V., Dokter, A. M., Blancher, P. J., Sauer, J. R., Smith, A. C., Smith, P. A., Stanton, J. C., Panjabi, A., Helft, L., Parr, M. & Marra, P. P. (2019). Decline of the North American avifauna. *Science* 366, 120.
- Schubert, K. A., Mennill, D. J., Ramsay, S. M., Otter, K. A., Boag, P. T. & Ratcliffe, L. M. (2007). Variation in social rank acquisition influences lifetime reproductive success in black-capped chickadees. *Biological Journal of the Linnean Society* 90, 85.
- Seddon, P. J., Armstrong, D. P. & Maloney, R. F. (2007). Developing the Science of Reintroduction Biology. *Conservation Biology* 21, 303.
- Sergio, F., Tanferna, A., De Stephanis, R., Jimenez, L. L., Blas, J., Tavecchia, G., Preatoni, D.

- & Hiraldo, F. (2014). Individual improvements and selective mortality shape lifelong migratory performance. *Nature* 515, 410.
- Shannon, G., Slotow, R., Durant, S. M., Sayialel, K. N., Poole, J., Moss, C. & McComb, K. (2013). Effects of social disruption in elephants persist decades after culling. *Frontiers in zoology* 10, 1.
- Shier, D. M. (2006). Effect of family support on the success of translocated black-tailed prairie dogs. *Conservation Biology* 20, 1780.
- Smales, I., Brown, P., Menkhorst, P., Holdsworth, M. & Holz, P. (2000). Contribution of captive management of Orange-bellied parrots to the recovery programme for the species in Australia. *International Zoo Yearbook* 37, 171.
- Snijders, L., Blumstein, D. T., Stanley, C. R. & Franks, D. W. (2017). Animal social network theory can help wildlife conservation. *Trends in ecology & evolution* 32, 567.
- Snyder, N. F. R., Koenig, S. E., Koschmann, J., Snyder, H. A. & Johnson, T. B. (1994). Thick-Billed Parrot Releases in Arizona. *The Condor* 96, 845.
- Sosa, S., Jacoby, D. M. P., Lihoreau, M. & Sueur, C. (2021). Animal social networks: Towards an integrative framework embedding social interactions, space and time. *Methods in Ecology and Evolution* 12, 4.
- Sosa, S., Sueur, C., Puga-Gonzalez, I. & Poisot, T. (2020). Network measures in animal social network analysis: Their strengths, limits, interpretations and uses. *Methods in Ecology and Evolution* 12, 10.
- Spiezio, C., Valsecchi, V., Sandri, C. & Regaiolli, B. (2018). Investigating individual and social behaviour of the Northern bald ibis (*Geronticus eremita*): behavioural variety and welfare. *PeerJ* 6, e5436.
- Stojanovic, D., Alves, F., Cook, H., Crates, R., Heinsohn, R., Peters, A., Rayner, L., Troy, S. N. & Webb, M. H. (2017). Further knowledge and urgent action required to save Orange-bellied Parrots from extinction. *Emu Austral Ornithology* 118, 126.
- Stojanovic, D., Hogg, C. J., Alves, F., Baker, G. B., Biggs, J. R., Bussolini, L., Carey, M. J., Crates, R., Magrath, M. J. L., Pritchard, R., Troy, S., Young, C. M. & Heinsohn, R. (2023). Conservation management in the context of unidentified and unmitigated threatening processes. *Biodiversity and Conservation*.
- Stojanovic, D., Neeman, T., Hogg, C. J., Everaardt, A., Wicker, L., Young, C. M., Alves, F., Magrath, M. J. L. & Heinsohn, R. (2021). Differences in wing shape of captive, critically endangered, migratory orange-bellied parrots *Neophema chrysogaster* relative to wild conspecifics. *Emu Austral Ornithology*, 1.
- Stojanovic, D., Potts, J., Troy, S., Menkhorst, P., Loyn, R. & Heinsohn, R. (2020). Spatial bias in implementation of recovery actions has not improved survival of Orangebellied Parrots *Neophema chrysogaster*. *Emu Austral Ornithology* 120, 263.
- Swift, K. N. & Marzluff, J. M. (2015). Wild American crows gather around their dead to learn about danger. *Animal Behaviour* 109, 187.
- Thorogood, R., Kokko, H. & Mappes, J. (2018). Social transmission of avoidance among predators facilitates the spread of novel prey. *Nature Ecology & Evolution* 2, 254.
- Troy, S. & Lawrence, C. (2022). Report on the Melaleuca wild population 2021/22.

  Tasmanian Orange-bellied parrot program (Ed.): Department of Natural Resources and Environment Tasmania.
- Turner, J. W., Robitaille, A. L., Bills, P. S., Holekamp, K. E. & Farine, D. (2021). Early-life relationships matter: Social position during early life predicts fitness among female spotted hyenas. *Journal of Animal Ecology* 90, 183.

VanderWerf, E. A., Crampton, L. H., Diegmann, J. S., Atkinson, C. T. & Leonard, D. L. (2014). Survival estimates of wild and captive-bred released Puaiohi, an endangered Hawaiian thrush. *The Condor* 116, 609.

Verhoeven, M. A., Loonstra, A. H. J., McBride, A. D., Kaspersma, W., Hooijmeijer, J., Both, C., Senner, N. R. & Piersma, T. (2022). Age-dependent timing and routes demonstrate developmental plasticity in a long-distance migratory bird. *Journal of Animal Ecology* 91, 566.

Villers, A., Millon, A., Jiguet, F., Lett, J.-M., Attie, C., Morales, M. B. & Bretagnolle, V. (2010). Migration of wild and captive-bred Little Bustards *Tetrax tetrax*: releasing birds from Spain threatens attempts to conserve declining French populations. *Ibis* 152, 254.

Weiss, M. N., Franks, D. W., Brent, L. J. N., Ellis, S., Silk, M. J. & Croft, D. P. (2021). Common datastream permutations of animal social network data are not appropriate for hypothesis testing using regression models. *Methods Ecol Evol* 12, 255.

White, T. H., Collar, N. J., Moorhouse, R. J., Sanz, V., Stolen, E. D. & Brightsmith, D. J. (2012). Psittacine reintroductions: Common denominators of success. *Biological Conservation* 148, 106.

Wickham, H. (2016). ggplot2: Elegant graphics for data analysis. *R package*. version 3.3.6. Wright, J., Stone, R. E. & Brown, N. (2003). Communal Roosts as Structured Information Centres in the Raven, *Corvus corax*. *Journal of Animal Ecology* 72, 1003.

### **Tables and Figures**

Table 1: List of models and AIC values for all models of a) standardised ranked strength, b) eigenvector centrality, c) individual coefficient of variation (CV), and d) first-migration survival. All models included the mean-centred number of observations as a fixed effect and year as a random effect. Models a-c also include individual ID as a random effect The preferred models for each response variable are highlighted in bold. Full model estimates are presented in Supplementary Material.

a)	Fixed Effects	df	AIC	$\Delta$ AIC	R <sub>2</sub> c	R <sub>2</sub> <sub>m</sub>
strength	Provenance * age class * release status + number of observations	10	-587.405	0.000	0.832	0.752
	Age class + number of observations	6	<b>-</b> 573.797	13.609	0.833	0.737
nked	Number of observations	5	-477.712	109.693	0.792	0.719
ed ra	Provenance + number of observations	6	-476.088	111.317	0.792	0.721
ardise	Release status + number of observations	6	-475-943	111.462	0.792	0.720
Standardised ranked	Sex + number of observations	6	-475.749	111.656	0.793	0.719
St	Null	4	-32.057	555.348	0.347	0.000

b)	Fixed Effects	df	AIC	$\Delta$ AIC	R <sub>2</sub> c	R <sub>2</sub> <sub>m</sub>
	Provenance * age class * release status + number of observations	10	-713.638	0.000	0.858	0.771
Eigenvector centrality	Age class + number of observations	6	-710.276	3.361	0.861	0.759
cent	Number of observations	5	-522.340	191.298	0.793	0.706
ector	Sex + number of observations	6	-520.737	192.900	0.793	0.708
lenve	Provenance + number of observations	6	-520.422	193.216	0.794	0.705
Eiç.	Release status + number of observations	6	-520.352	193.286	0.793	0.707
	Null	4	-49-947	663.691	0.410	0.000

c)	Fixed Effects	df	AIC	$\Delta$ AIC	R <sub>2</sub> c	R <sub>2</sub> <sub>m</sub>

	Age class + number of observations	6	-81.288	0.000	0.293	0.200
	Provenance * age class * release status + number of observations	10	-74.608	6.680	0.297	0.201
Jal CV	Number of observations	5	-73.348	7.941	0.275	0.186
Individual	Provenance + number of observations	6	-72.157	9.131	0.293	0.200
<u>u</u>	Sex + number of observations	6	-72.069	9.219	0.278	0.187
	Release status + number of observations	6	-71.501	9.788	0.274	0.186
	Null	4	45.077	126.366	0.115	0.000

d)	Fixed Effects	df	AIC	∆ AIC	R <sub>2</sub> c	R <sub>2</sub> <sub>m</sub>
	Provenance * age class * release status + number of observations	6	467.813	0.000	0.080	0.080
ırvival	Provenance * age class * release status * individual CV + number of observations	10	471.487	3.673	0.102	0.102
First-migration survival	Provenance * age class * release status *standardised ranked strength + number of observations	10	473.471	5.658	0.088	0.088
First-m	Provenance * age class * release status * eigenvector centrality+ number of observations	10	474.125	6.312	0.089	0.089
	Null	2	477.547	9.733	0.002	0.000

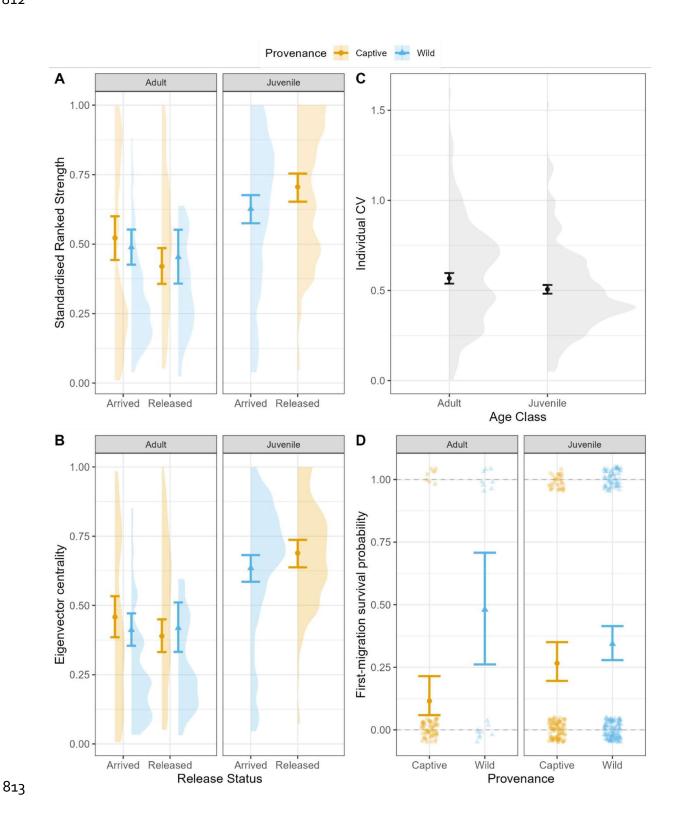


Figure 1: Model estimates (points) and 95% confidence intervals for **A.** standardised ranked strength, and **B.** eigenvector centrality as a function of provenance x age class x release status, **C.** individual CV as a function of age class, and **D.** first migration survival as a function of

provenance x age class. **A-C**: Number of observations has been included as a fixed effect, while year and individual ID have been included as random effects in all models. Density curves show the distribution of the raw data. **D:** First-migration survival analysis includes both captive and wild adults released in spring and all juveniles. Year has been added as a random effect. Points show the raw data and have been vertically offset to improve visualisation.



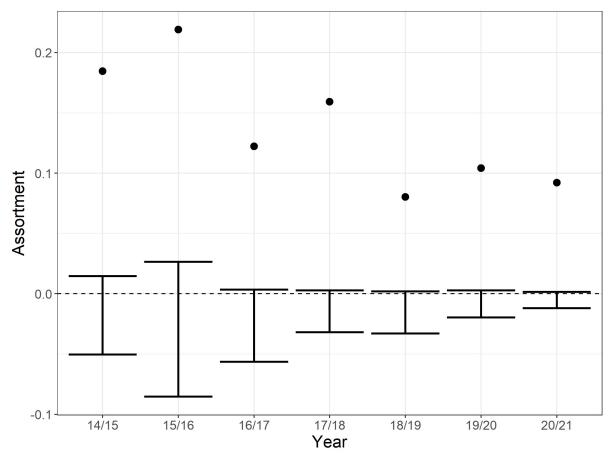


Figure 2: coefficient of assortment (points) between different demographic cohorts

(provenance x age class x release status) for each season compared against 95% range of
assortment coefficients calculated from 10,000 random permutations of the data (error bars).

This shows a high degree of preferential assortment between demographic cohorts, as the
assortment coefficient is well above the range expected by chance.

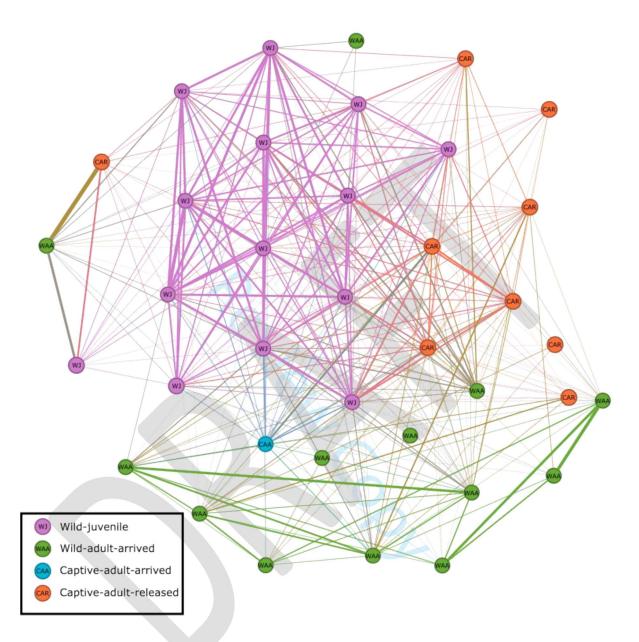


Figure 3: an orange-bellied parrot social network for a six-week period in early 2016. Nodes (points) represent individual birds and are coloured based on demographic cohorts. Edges (lines) represent co-occurrence in a group, with edge width proportional to the number of co-occurrences and coloured based on age class. This network plotted with a Fruchterman-Reingold layout.

## Effects of age and captivity on the social structure and migration survival of a critically endangered bird

**Supplementary Materials** 

Table S1: a) Descriptions of each demographic cohort classified by an individuals' provenance ('wild' or 'captive'), age class ('adult' or 'juvenile'), and release status ('arrived' or 'released'), along with sample sizes for analysis of both social metrics (including standardised ranked strength, eigenvector centrality, and assortment) and first migration survival. B) Sample sizes for the number of adults and the number of juveniles included in the CV analysis. The calculation of individual CV was done using an expanded dataset and the preferred model only included the single term of age class.

a.)

Cohort	Definition:	n – social analysis	n – survival analysis
Wild – adult – arrived (WAA)	Adult bird hatched in the wild who arrived from migration.	108	Excluded from survival analysis as successfully completed previous migration(s).
Captive – adult – arrived (CAA)	Captive-bred adult bird who arrived from migration; released in a previous year.	37	Excluded from survival analysis as successfully completed previous migration(s).
Wild – adult – released (WAR)	Wild-born bird who fledged from a wild nest and lived as a wild juvenile for several weeks before being captured and held in captivity over the winter period as part of management strategies ('head-started'). These birds were released the following spring as adults.	21	17
Captive – adult – released (CAR)	Captive-bred adult birds released in spring.	85	69
Wild – juvenile – arrived (WJA)	Wild-born juveniles. All wild juveniles arrived into the population by definition.	215	186
Captive – juvenile – released (CJR)	Captive-bred juveniles released in late autumn. All captive-bred juveniles are released by definition.	124	124

Totals:	590	396

b)	
Age class	Sample size for CV analysis
Adult	251
Juvenile	343
Total	594



 Table S2: Model estimates and 95% confidence levels (CL) for the preferred models for a) standardized ranked strength, b) eigenvector centrality, c) individual coefficient of variation (CV), and d) first migration survival. Model estimates have been back transformed from the logit (a, b, d) scale. All models include the mean-centred number of observations as a fixed effect, with year and individual ID as a random effect.

a)	Provenance * age class * release status	Model estimate	SE	df	Lower CL	Upper CL
pa	Wild - adult - arrived	0.489	0.033	580	0.426	0.553
ranked ۱	Captive - adult - arrived	0.528	0.041	580	0.448	0.607
	Wild - adult - released	0.454	0.050	580	0.358	0.553
Standardised strengt	Captive - adult - released	0.422	0.033	580	0.358	0.488
and	Wild - juvenile - arrived	0.629	0.026	580	0.576	0.679
St	Captive - juvenile - released	0.705	0.026	580	0.652	0.754

b)	Provenance * age class * release status	Model estimate	SE	df	Lower CL	Upper CL
	Wild - adult - arrived	0.413	0.030	580	0.355	0.473
ے ہ	Captive - adult - arrived	0.459	0.038	580	0.386	0.535
Eigenvector centrality	Wild - adult - released	0.420	0.046	580	0.333	0.512
gen	Captive - adult - released	0.390	0.030	580	0.332	0.450
🖫 🔾	Wild - juvenile - arrived	0.636	0.025	580	0.586	0.683
	Captive - juvenile - released	0.690	0.025	580	0.639	0.738

c)	Age class	Model estimate	SE	df	Lower CL	Upper CL
idual V	Adult	0.567	0.015	583	0.538	0.596
Individu	Juvenile	0.506	0.012	583	0.482	0.530

d.)	Provenance * age class * release status	Model estimate	SE	df	Lower CL	Upper CL
<u>c</u>	Wild - adult - released	0.481	0.123	390	0.261	0.708
gratio	Captive - adult - released	0.115	0.039	390	0.0586	0.215
First-migration survival	Wild - juvenile - arrived	0.343	0.035	390	0.278	0.415
E 	Captive - juvenile - released	0.266	0.040	390	0.195	0.351

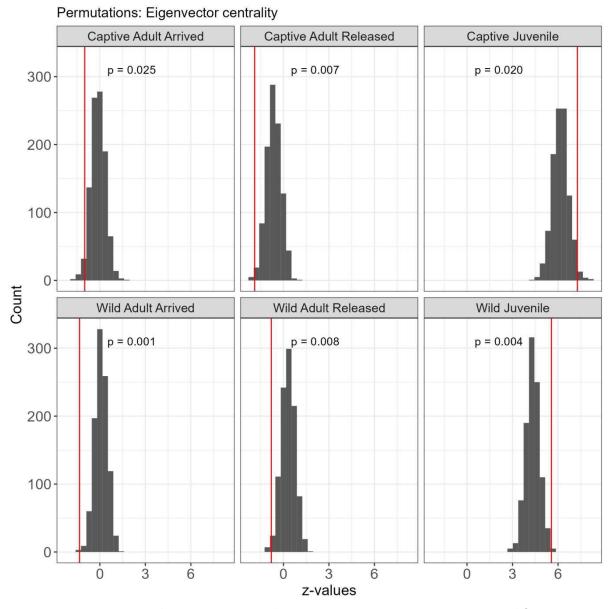


Figure S1: Histograms showing 1000 model test statistics (z-values) generated from randomised networks (grey) against the model test statistic generated from the actual data (red line) for eigenvector centrality. Corresponding p-values are shown on each plot.

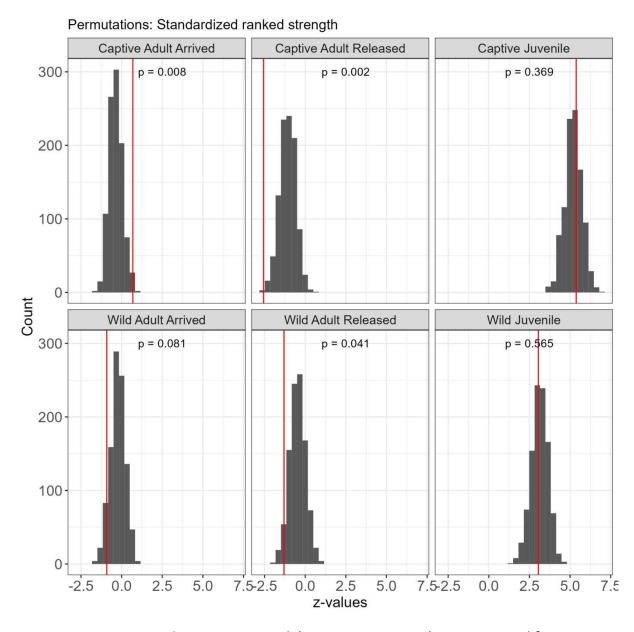


Figure S2: Histograms showing 1000 model test statistics (z-values) generated from randomised networks (grey) against the model test statistic generated from the actual data

(red line) for standardised ranked strength. Corresponding p-values are shown on each plot.

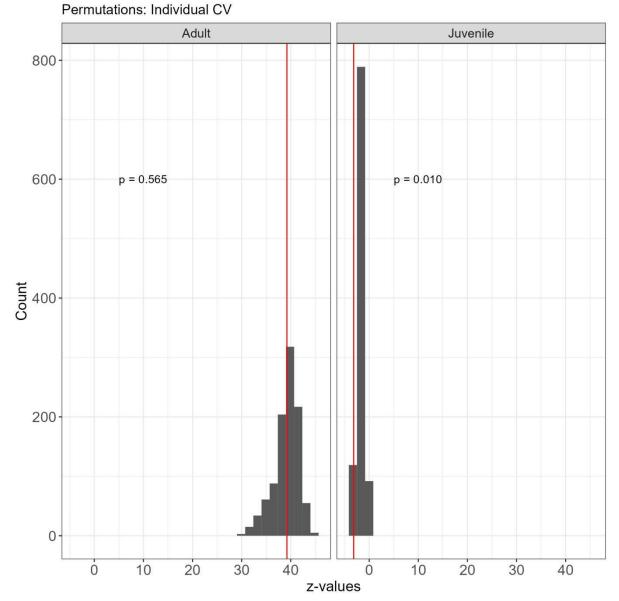


Figure S3: Histograms showing 1000 model test statistics (z-values) generated from randomised networks (grey) against the model test statistic generated from the actual data (red line) for individual CV. Corresponding p-values are shown on each plot.

Table S3: Mixing matrices for assortment by demographic cohorts for each breeding season (2014/15 – 2020/21) showing the distribution of edge weights (% of total) between each group from the simple-ratio index weighted network. The tables are symmetric, therefore only half the values are shown. Cohorts are abbreviated by provenance ('wild' or 'captive'), age class ('adult' or 'juvenile') and release status ('arrived' or 'released').

14/15         WAA         CAA         CAR         WJA         ai           WAA         0.166         -         -         -         -           CAA         0.037         0.013         -         -         -           CAR         0.093         0.036         0.122         -         -           WJA         0.040         0.015         0.072         0.117         -           bi         0.336         0.100         0.322         0.243         1.000           15/16         WAA         CAA         CAR         WJA         Ai           WAA         0.088         -         -         -         -           CAR         0.042         0.007         -         -         -           CAA         0.005         0.000         0.007         -         -         -           WJA         0.064         0.013         0.088         0.440         -         -           bi         0.199         0.026         0.169         0.605         1.000           DAR         0.049         -         -         -         -           WJA         0.048         0.160         -	
CAA       0.037       0.013       -       -       -       -         CAR       0.093       0.036       0.122       -       -         WJA       0.040       0.015       0.072       0.117       -         bi       0.336       0.100       0.322       0.243       1.000         15/16       WAA       CAA       CAR       WJA       ai         WAA       0.088       -       -       -       -         CAR       0.042       0.007       -       -       -         CAA       0.005       0.000       0.007       -       -         WJA       0.064       0.013       0.088       0.440       -         bi       0.199       0.026       0.169       0.605       1.000         16/17       WAA       CAR       WJA       ai         WAA       0.049       -       -       -         CAR       0.064       0.160       -       -         WJA       0.048       0.160       0.248       -	
CAR 0.093 0.036 0.122 WJA 0.040 0.015 0.072 0.117 WJA 0.336 0.100 0.322 0.243 1.000  15/16 WAA CAA CAR WJA ai  WAA 0.088 CAA 0.005 0.000 0.007 WJA 0.064 0.013 0.088 0.440 WJA 0.199 0.026 0.169 0.605 1.000  16/17 WAA CAR WJA ai  WAA 0.049	
WJA       0.040       0.015       0.072       0.117       -         bi       0.336       0.100       0.322       0.243       1.000         15/16       WAA       CAA       CAR       WJA       ai         WAA       0.088       -       -       -       -         CAR       0.042       0.007       -       -       -         CAA       0.005       0.000       0.007       -       -         WJA       0.064       0.013       0.088       0.440       -         bi       0.199       0.026       0.169       0.605       1.000         16/17       WAA       CAR       WJA       ai         WAA       0.049       -       -       -         CAR       0.064       0.160       -       -         WJA       0.048       0.160       0.248       -	
bi       0.336       0.100       0.322       0.243       1.000         15/16       WAA       CAA       CAR       WJA       ai         WAA       0.088       -       -       -       -         CAR       0.042       0.007       -       -       -         CAA       0.005       0.000       0.007       -       -         WJA       0.064       0.013       0.088       0.440       -         bi       0.199       0.026       0.169       0.605       1.000         16/17       WAA       CAR       WJA       ai         WAA       0.049       -       -       -         CAR       0.064       0.160       -       -         WJA       0.048       0.160       0.248       -	
15/16         WAA         CAA         CAR         WJA         ai           WAA         0.088         -	
WAA       0.088       - </td <td></td>	
CAR       0.042       0.007       -       -       -       -         CAA       0.005       0.000       0.007       -       -       -         WJA       0.064       0.013       0.088       0.440       -         bi       0.199       0.026       0.169       0.605       1.000         16/17       WAA       CAR       WJA       ai         WAA       0.049       -       -       -         CAR       0.064       0.160       -       -         WJA       0.048       0.160       0.248       -	
CAA 0.005 0.000 0.007 WJA 0.064 0.013 0.088 0.440 bi 0.199 0.026 0.169 0.605 1.000  16/17 WAA CAR WJA ai WAA 0.049 WJA 0.064 0.160 WJA 0.048 0.160 0.248 -	
WJA 0.064 0.013 0.088 0.440 -  bi 0.199 0.026 0.169 0.605 1.000  16/17 WAA CAR WJA ai  WAA 0.049  CAR 0.064 0.160  WJA 0.048 0.160 0.248 -	
bi       0.199       0.026       0.169       0.605       1.000         16/17       WAA       CAR       WJA       ai         WAA       0.049       -       -       -         CAR       0.064       0.160       -       -         WJA       0.048       0.160       0.248       -	
16/17       WAA       CAR       WJA       ai         WAA       0.049       -       -       -         CAR       0.064       0.160       -       -         WJA       0.048       0.160       0.248       -	
WAA 0.049  CAR 0.064 0.160  WJA 0.048 0.160 0.248 -	
CAR 0.064 0.160 WJA 0.048 0.160 0.248 -	
WJA 0.048 0.160 0.248 -	
bi 0.161 0.384 0.455 1.000	
<b>17/18</b> WAA CAA CAR WJA CJR αi	
WAA 0.037	
CAA 0.003 0.000	
CAR 0.022 0.003 0.041	
WJA 0.022 0.004 0.073 0.270	
CJR 0.006 0.001 0.034 0.114 0.089 -	
bi 0.089 0.010 0.174 0.483 0.243 1.000	
18/19 WAA CAA WAR CAR WJA CJR	ai
WAA 0.019	
CAA 0.001	-
WAR 0.013 0.004 0.009	-

CAR	0.017	0.005	0.018	0.027	-	-	-
WJA	0.021	0.009	0.029	0.059	0.251	-	-
CJR	0.006	0.005	0.008	0.021	0.106	0.047	-
bi	0.078	0.024	0.081	0.148	0.476	0.193	1.000
19/20	WAA	CAA	WAR	CAR	WJA	CJR	ai
WAA	0.012	-	-	-	-	-	-
CAA	0.006	0.004	-	-	-	-	-
WAR	0.014	0.006	0.013	-	-	-	-
CAR	0.005	0.003	0.004	0.001	-	-	-
WJA	0.007	0.010	0.007	0.008	0.112	-	-
CJR	0.024	0.021	0.034	0.019	0.132	0.258	-
bi	0.068	0.050	0.078	0.040	0.275	0.488	1.000
	_						
20/21	WAA	CAA	CAR	<b>WJA</b>	CJR	ai	
WAA	0.015	-	-	/-	-	-	
CAA	0.013	0.013	-		-	-	
CAR	0.009	0.008	0.007		_	-	
WJA	0.026	0.030	0.029	0.244	7 -	-	
CJR	0.014	0.018	0.018	0.140	0.111	-	
bi	0.077	0.082	0.071	0.469	0.302	1.000	

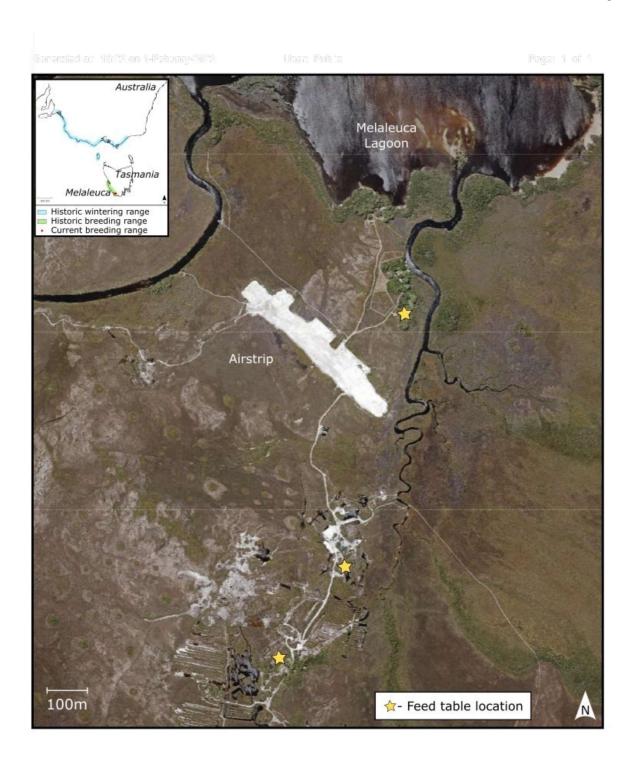


Figure S4: map of historic and current orange-bellied parrot distribution (insert), and location of supplementary feeding tables in the Melaleuca area (main). Orange-bellied parrots have bred exclusively in the Melaleuca valley since the late 2000's.

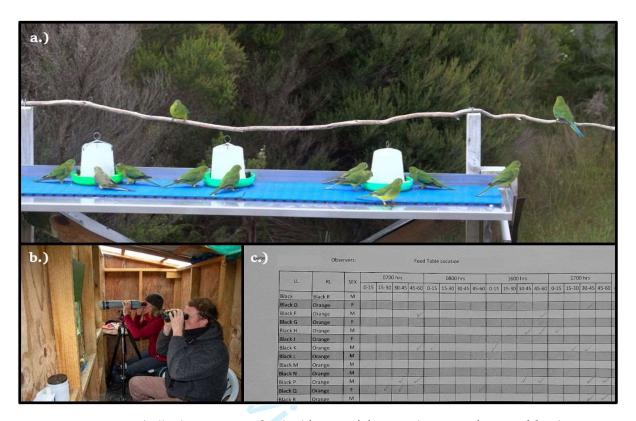
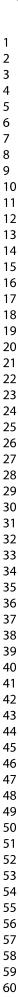


Figure S<sub>5</sub>: a) orange-bellied parrots at a feed table at Melaleuca, where supplemental food is provided throughout the breeding season (photo credit: Dave Watson https://www.flickr.com/photos/183228396@No5/49535645158/). b)Volunteers monitor the feed tables for four hours each day (photo credit: NRE Tas), and c) record whether an individual bird is present or absent in each 15-minute increment (photo credit: LTB). Birds are identified via unique band combination, and only birds that land on the table as recorded as present.



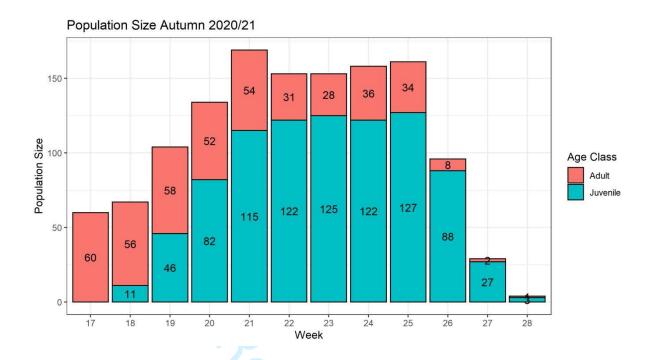


Figure S6: an example of the population fluctuations seen in the orange-bellied parrot population from week to week from 13 January – 6 April 2021. Adults are shown in red, juveniles in blue. Numbers represent the total number of unique individual birds in each group detected at a feed table in a given week. This year was chosen as an example to highlight the variation in the population and why the social network analysis was limited to a six-week period.

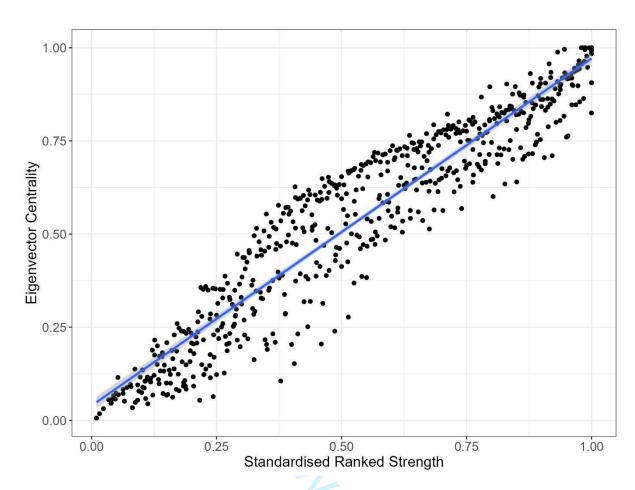


Figure S7: Correlation between standardised ranked strength and eigenvector centrality; these two values are highly correlated with a correlational coefficient of 0.943 (95% CI: 0.934 – 0.952). Both metrics are bound between 'o' and '1'; points show raw data for individual birds.