Cohort effect on discriminant rate: the case of greater flamingo (*Phœnicopterus roseus*) chicks sexed with morphological characters

Abdennour Boucheker\textsuperscript{1,2,3}, Riad Nedjah\textsuperscript{3}, Roger Prodon\textsuperscript{4}, Mark Gillingham\textsuperscript{2,5}, François-Xavier Dechaume-Moncharmont\textsuperscript{3,6}, Arnaud Béchet\textsuperscript{2}, and Boudjéma Samraoui\textsuperscript{1,3}

\textsuperscript{1}Biology Department, Badji Mokhtar University-Annaba, BP 12, Annaba, 23000, Algeria
\textsuperscript{2}Centre de recherche de la Tour du Valat, Le Sambuc, 13200 Arles, France
\textsuperscript{3}Laboratoire de Conservation des Zones Humides, Université 8 mai 1945, BP 401, Guelma 24000, Algeria
\textsuperscript{4}Centre d’Ecologie Fonctionnelle et Evolutive (UMR 5175), École Pratique des Hautes Études, Biogéographie et Ecologie des Vertébrés, campus CNRS, 1919 route de Mende, 34293 Montpellier CEDEX 5, France
\textsuperscript{5}Institute of Experimental Ecology, University of Ulm, Albert-Einstein Allee 11, 89069 Ulm, Germany
\textsuperscript{6}Université Claude Bernard Lyon 1, CNRS, ENTPE, UMR 5023 LEHNA, 69622, Villeurbanne, France

Correspondence: Abdennour Boucheker (babdennour2007@yahoo.fr)

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Abstract. We used a large dataset of greater flamingo chicks banded and measured at Camargue, France, to verify the applicability of discriminant function analysis to sex this species. Males and females sexed genetically differed significantly in all of the morphological characters measured (body mass, tarsus and wing length), with males being significantly larger than females. Although the discriminant rate varied substantially from one year to another, we found that it increased with the sample size of genetically sexed individuals. Our results suggest that discriminant function analysis (DFA) does not provide an efficient tool to sex greater flamingo chicks as these relationship are highly variable across years, requiring the genetic determination of sex on a large number of individuals every year for calibrating the DFA and still providing an overall low accuracy in sex determination. Indeed, conditions at breeding seasons can vary between years and can be considered proximate causes affecting the correct discriminant rate. Like previous studies, we recommend caution in dealing with discriminant equations computed from small datasets, and our simulation suggests that 325 genetically sexed individuals are needed to obtain 80\% correctly classified greater flamingo chicks.

1 Introduction

The ability to correctly sex marked birds is crucial to most behavioral or ecological studies (Greenwood, 1980; Andersson, 1994; Short and Balaban, 1994; Childress and Bennun, 2002; Barbraud et al., 2003) and for the management and conservation of species (Zavalaga and Paredes, 1997; Fernandez-Juricic, et al., 2003). However, sex determination in immature and adult individuals where the plumage is similar in both sexes based on external morphological characters is often difficult (Cuthill et al., 1999).

To overcome this difficulty a range of techniques have been used such as laparoscopy (Petrides, 1950; Richter and Bourne, 1990; Richner, 1989), measuring the plasma testosterone levels during the breeding period (Czekala and Lasley, 1977; Bercovitz et al., 1978), vocalization analyses (Bourgeois et al., 2007), individual breeding or observation of territorial behavior (Castoro and Guhl, 1958; Flux and Innes, 2001; Fletcher and Hamer, 2003), and generalized molecular techniques (Griffiths et al., 1998; Bertault et al., 1999; Fridolfsson and Ellegren, 1999; Tomasulo et al., 2002; Dubiec and Zagalska-Neubauer, 2006; Balkiz et al., 2007). However, despite the reliability and the large utilization of molecular techniques, these methods are time-consuming, intrusive and require extensive laboratory equipment, implying additional financial costs (Childress et al., 2005).
Sexing based on morphological measurements using multivariate statistical approaches (e.g., discriminant function analysis, DFA) is often a reasonable choice for quick and inexpensive but efficient sex identification in field studies on bird species presenting monomorphic plumage (Dechaume-Moncharmont et al., 2011). Indeed, the existence of a significant difference (even very small) between morphological measurements of males and females allows the discrimination between the sexes (Wilson, 1999; Donohue and Dufty, 2006; Moreno et al., 2007; Murphy, 2007; Ottvall and Gunnarsson, 2007; Cardoni et al., 2009). Diverse discriminant and logistic regression functions based on morphological measurements have been developed in many bird studies designed for widespread use by field researchers (Bosch, 1996; Balbontin et al., 2001; Bertellotti et al., 2002; Delvin et al., 2004; Figureola et al., 2006; Hallgrimson et al., 2011). However, different methods can be used to assess the reliability of these functions by examining the proportion of correctly classified males and females, such as, resubstitution (Zwarts et al., 1996; Copello et al., 2006), jackknife (O’Dwyer et al., 2006; Thorogood et al., 2009; Herring et al., 2008, 2010) or sample splitting methods (Setiawan et al., 2004; Meissner, 2005; Frey et al., 2008). Dechaume-Moncharmont et al. (2011) showed that the choice of the validation method may have a strong effect on the estimated discriminant rate, particularly for small sample sizes, and recommended the use of the jackknife method.

In this study, we used a large dataset (4013 birds measured across 11 years) of greater flamingo (Phoenicopterus roseus) chicks ringed and measured in the Camargue (southern France) and afterward sexed with molecular techniques (Bertault et al., 1999; Balkız et al., 2007). Greater flamingos lay a single egg and have a wide distribution, ranging from west Africa eastward throughout the Mediterranean to southwest and south Asia, and throughout sub-Saharan Africa (Johnson and Cézilly, 2007). Both sexes are similar in plumage but are sexually dimorphic in size when adults (Johnson and Cézilly, 2007). Although immature and adult male greater flamingos are significantly larger and heavier than females (Cramp and Simmons, 1977; Johnson et al., 1993), there remains a risk of error in sex determination based on size or weight due to the overlap of larger (and heavier) females with smaller (and lighter) males. This overlap is possibly wider in chicks, yet tarsus length of males appeared longer than that of females of exactly the same age in unfledged chicks from captivity (Studer-Thiersch, 1986).

The purposes of our study were to (1) examine whether DFA relying on morphological measurements of greater flamingo chicks predicts sex with a sufficient degree of accuracy, (2) test the applicability of one of the 11 single DFA formulas across cohorts and (3) evaluate through simulations the minimal sample size of chicks sexed by molecular methods to generate a DFA with a reliable discriminant rate.

2 Material and methods

As part of a long-term study on the reproductive biology of a colony of greater flamingos in Camargue, southern France (43°25′ N, 4°38′ E), a proportion of chicks were captured at the end of each breeding season (end of July–early August) and banded with a metal ring and a unique combination of plastic bands that allowed recognition of individuals. For each chick, only three external measurements were made (body weight, tarsus length and wing length; Childress et al., 2005) to avoid prolonged capture stress. Thus, between 1995 and 2008 (except for 2001, 2002 and 2007), a total of 4013 Flamingos chicks were captured. A total of 1828 males and 2187 females were genetically sexed through PCR (polymerase chain reaction) amplification of the CHD-Z and CHD-W genes, using DNA extracted from blood or feather samples (Bertault et al., 1999, Balkız et al., 2007).

2.1 Discriminant analysis functions

For each cohort, we applied Box’s M test to verify the homogeneity of the variance–covariance matrix assumption before performing quadratic DFA in the case of violation of the assumption, otherwise linear DFA (Stevens, 1992) was used. These were conducted with the qda or lda function from the MASS package (Venables and Ripley, 2002) in R (version 3.6.1; R Development Core Team, 2019). To estimate the proportion of individuals with correctly classified sex (discriminant rate), we used the jackknife method (leave one out) (Manly, 1994): the sex of an individual is predicted from the DFA calculated after that individual has been taken out from the dataset. This procedure is repeated until a sex is assigned to each individual (Tabachnick and Fidell, 2000). Then, we examined whether the DFA for a given year could provide (or not) a reliable discriminant rate across cohorts. Finally, we used Student’s t test and Cohen’s d effect size to calculate the difference between mean male and female chicks external measurements.

2.2 Effect of sample size

We simulated the effect of sample size on the discriminant rate using the largest dataset available, i.e., 2006. We defined 133 different sample sizes regularly spaced every five individuals and ranging from 25 to 685 individuals. For each sample size, we used the jackknife method to simulate 500 different datasets by randomly sampling individuals (Table 1). We then calculated the mean DFA for each random dataset for a given sample size.

3 Results

3.1 Sexual dimorphism

We found significant differences in all morphological characters analyzed of genetically sexed greater flamingo chicks...
### Table 1. Potential of discriminant function analysis in sexing greater flamingo chicks. Discriminant rate (%) and correctly classified individual (%). WL: wing length; TL: tarsus length; BM: body mass.

| Year | Chick sample | Box’s M test | Discriminant formulas | Discriminant rate (%) | Correctly classified individual (%) |
|------|--------------|--------------|-----------------------|-----------------------|------------------------------------|
|      | Males | Females     | Chi 2 Degrees of freedom |                      |         |
| 1995 | 67    | 105         | 12.8 6 0.04 qda         | TL + WL               | 80.3     | 64.6 |
| 1996 | 64    | 67          | 15.5 6 0.01 qda         | TL + WI               | 78.6     | 73.4 |
| 1997 | 188   | 221         | 20.4 6 0.00 qda         | TL + WI + BM          | 78.3     | 84.5 |
| 1998 | 162   | 267         | 16.5 6 0.01 qda         | TL + WI + BM          | 75.2     | 87.8 |
| 1999 | 171   | 253         | 26.0 6 0.00 qda         | TL + WI + BM          | 85.5     | 82.9 |
| 2000 | 235   | 240         | 9.9 6 0.12 lda          | D 2000 = -10.50 - 0.02 × WL + 0.06 × TL + 0.001 × BM | 75.2     | 72.3 |
| 2003 | 47    | 50          | 19.7 6 0.00 lda         | D 2003 = -13.57 - 0.03 × WL + 0.003 × TL + 0.002 × BM | 85.7     | 85.7 |
| 2004 | 239   | 301         | 6.4 6 0.38 lda          | D 2004 = -12.38 - 0.03 × WL + 0.001 × TL + 0.002 × BM | 82.2     | 80.0 |
| 2005 | 251   | 364         | 11.9 6 0.06 lda         | D 2005 = -11.38 - 0.03 × WL + 0.002 × TL + 0.001 × BM | 83.0     | 87.7 |
| 2006 | 321   | 260         | 35.6 6 0.00 lda         | D 2006 = -10.50 - 0.02 × WL + 0.06 × TL + 0.001 × BM | 86.5     | 83.2 |
| 2008 | 264   | 290         | 42.1 6 0.12 lda         | D 2008 = -10.50 - 0.02 × WL + 0.06 × TL + 0.001 × BM | 76.6     | 71.2 |
| All years | 1828 | 2185        | 143.5 6 0.00 lda        | TL + WI + BM          | 67.1     | 60.4 |
|          |       |             |                       |                      | 83.6     |      |

(males were larger than females ($t = 33.7$, $p < 0.000000000000000000$)), and the mean difference index (MDI = $100 \times$ mean female/mean male; Delestrade, 2001; Helfenstein et al., 2004) was < 95% for all characters (Table 2). Pooling all years, the largest difference occurred in body weight (males being 1.1 times heavier than females, Cohen’s $d = 0.8$). Dimorphism in tarsus length was also important for all years (ratio male/female = 1.1, Cohen’s $d = 0.9$ and was less important for wing length (ratio male/female = 1.0, Cohen’s $d = 0.3$; Table 2; Fig. 1).

### 3.2 Sex determination

The discriminant rate of greater flamingo chicks using DFA was always > 70%, yet varied substantially across cohorts (Table 1). Females were always better discriminated than males (Table 1). Evaluating whether one particular annual DFA could correctly predict sex across years showed major differences in the discriminant rate. For instance, the result found using the DFA of 2006 (the largest dataset) on the different clinics led to a large difference of correct sex determination (from 52.4% in 2000 to 86.5% in 2006; Fig. 2), and the all-year function had the lowest discriminant rate (Table 1).
Table 2. Comparisons between male and female greater flamingo chicks on Camargue (1995 to 2008, except 2001, 2002 and 2007) for three characters with mean difference index (MDI) calculated as (mean female / mean male) × 100.

| Measurements       | Males (mean ± SD) | Females (mean ± SD) | Cohen’s d (95% CI) | MDI (%) | t test  | P     |
|---------------------|-------------------|---------------------|--------------------|---------|---------|-------|
| N                   | 1828              | 2185                |                    |         |         |       |
| Body mass (g)       | 2629.6 ± 489.8    | 2255.3 ± 418.6      | 0.8 [0.8, 0.9]     | 85.8    | 26.1    | 0.000*** |
| Tarsus length (mm)  | 233.7 ± 23.6      | 214.4 ± 20.8        | 0.9 [0.8, 0.9]     | 92.0    | 27.5    | 0.000*** |
| Wing length (mm)    | 300.5 ± 62.9      | 283.9 ± 64.2        | 0.3 [0.2, 0.3]     | 94.5    | 8.3     | 0.000*** |

Figure 2. Boxplots of the yearly estimated discriminant rate (results of yearly DFA formulas validated on 11 different cohorts (1995–2008, except 2001, 2002 and 2007)).

3.3 Sample size effect

Obtained discriminant rates of correctly sexed greater flamingo chicks increased with increasing sample size. Indeed, the lowest DFA simulation results for samples of 50, 200 and 325 individuals were 58.0%, 76.6% and 80.0%, respectively (Fig. 3).

4 Discussion

In the greater flamingos, as in many other birds, adult males are larger than females. However, sexing flamingo chicks remains difficult because flamingos continue to grow after fledging, and captures generally include individuals of different ages. Sexual dimorphism occurs in flamingos chicks with females of 1.5 to 2.5 months being already smaller than males of the same age (Studer-Thiersch, 1986; but see Bertault et al., 2000). Our results demonstrate that the sex of greater flamingo chicks can be determined based on individual morphology using DFA and a subsample of individuals molecularly sexed. This method was also used for adult greater flamingos (Richter and Bourne, 1990) and other birds, where morphometric criteria may discriminate between males and females (Childress et al., 2005; Alarcos et al., 2007; Hurley et al., 2007; Ackerman et al., 2008; Herring et al., 2008; Lislevand et al., 2009; Herring et al., 2010).

Figure 3. Simulation of the effect of sample size on the estimated proportion of correctly classified individuals (discriminant rate) in simulated discriminant function analyses (DFAs) of greater flamingo chicks from Camargue (France). From the largest dataset (year 2006, n = 685 individuals), smaller subsamples were randomly selected (ranging from 25 to 685 individuals, with 500 subsamples per size). For each of these 66,000 subsamples, we performed a DFA and evaluated the discriminant rate by jackknife cross-validation. Each red empty circle represents one DFA. The thick white line represents the mean discriminant rate computed from the 500 DFAs performed for each sample size. The dashed white line represents the DFA of the year 2006.
However, we found that the reliability of one particular yearly discriminant function was reduced when attempting to apply it across cohorts. This result was consistent with the Evans et al. (1993) study on laughing gulls (*Larus atricilla*); they found a significant difference when DFA was applied at different years and localities. We also found that females were better discriminated than males in all years. The lower discriminant rate for males could result from an asymmetry in the distribution of the size of the males with an overrepresentation of smaller males. The discriminant rate of greater flamingo chicks varied from 67.1% to 86.5% and was lower than in other waterbird studies: Chilcott rate of greater flamingo chicks varied from 67.1% to 89.5%. Furthermore, our simulation showed that for small samples, there is a wide variance in the proportion of misclassified birds. Indeed, a high or low discriminant rate can be obtained by chance (low or high misclassified); therefore the use of a formula constructed from a small dataset is problematic in the greater flamingos and should be avoided. Like previous studies, we recommend extreme caution when sexing birds based on DFA, particularly when discriminant equations are derived from small datasets (Brennan et al., 1991; Shealer and Cleary, 2007; isaksson et al., 2008; Dechaume-Moncharmont et al., 2011). Our results show that sexing flamingo chicks based on DFA requires a large dataset and repeated sampling to include natural yearly variations on body condition during the breeding season. We therefore conclude that DFA is not an effective method to sex flamingo chicks.

Data availability. The data that support the findings of this study are available from the Tour du Valat greater flamingo team (bechet@touarduvalat.org), upon reasonable request.

Author contributions. AbB designed and conducted the study under the supervision of AB, RP and BS. AbB designed the statistical analyses and wrote the text. AB, RP and BS supervised and commented on the text. RN, MG and FXDM commented on the text.

Competing interests. The authors declare that they have no conflict of interest.

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