

Evaluation of changes in the Sebket of Aures wetlands complex by remote sensing and their importance for the reception of Anatidae

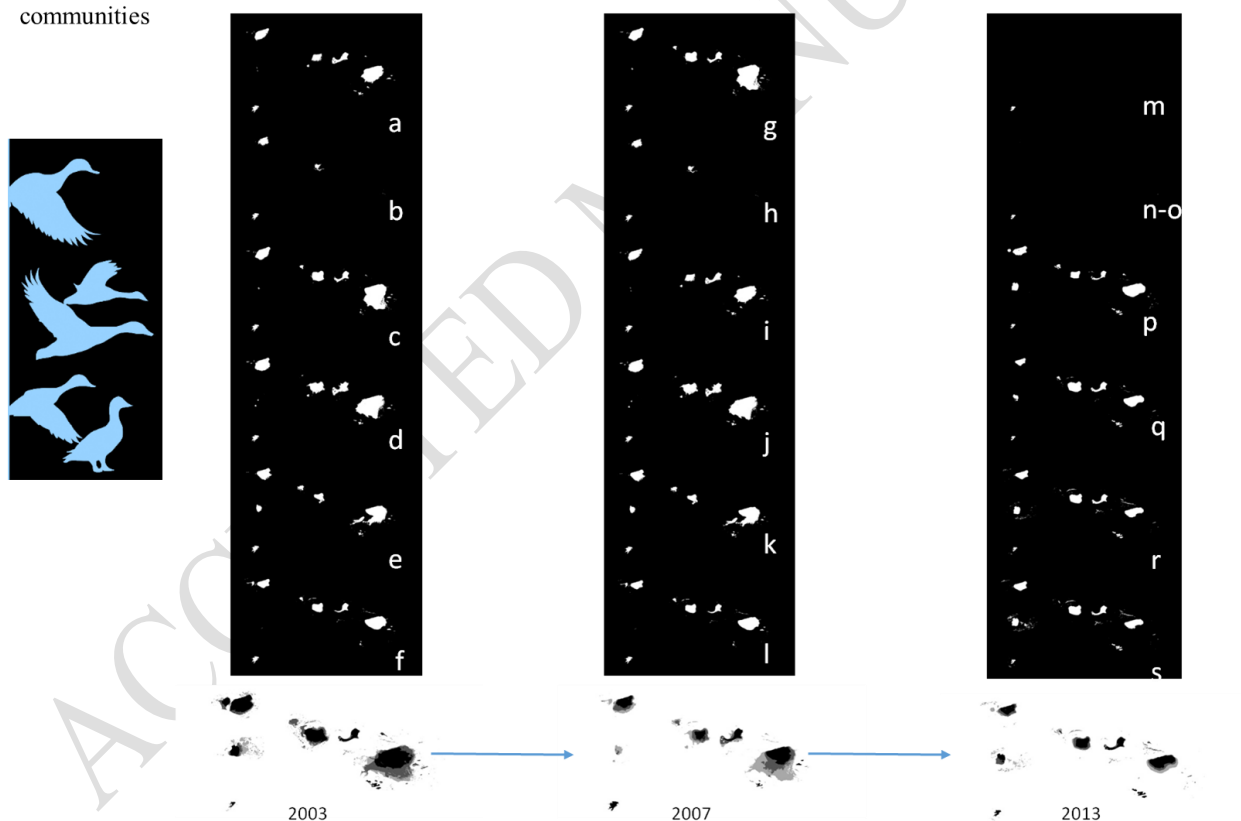
Rima Boukaba¹, Imene Benzina², Abdelkrim Si Bachir², Farid Bekdouche²

¹ Department of Ecology and Environment, Faculty of Nature and Life Sciences, University Mostefa Benboulaïd Batna 2, 05078 - Algeria

² Laboratory 'Biodiversity, Biotechnology and Sustainable Development', Faculty of Nature and Life Sciences, University Mostefa Benboulaïd Batna 2, 05078 - Algeria

Graphical abstract

Temporal Evolution of Wetland Habitats in the Sebkhates of Aurès complexe and their function in supporting anatidae communities



17 **Abstract**

18 By employing spatial observation methods and analyzing satellite imagery on both intra- and inter-
19 annual scales, we were able to delineate the boundaries of the Sebket of Aurès Wetlands Complex
20 (SAWC) located in northeastern Algeria. The study focused on seven major wetlands, encompassing
21 a total surface area of 48,540 hectares, with altitudes ranging from 370 to 900 meters, which supports
22 a high level of ecological diversity. The treatment, by classifying the water surfaces and the wet
23 surfaces present on 19 images used, enabled to visualize the variation within the timeframe of each
24 site submersion. The results indicated that precipitation is the primary factor driving these variations.
25 In 2003, an annual precipitation of 502.06 mm corresponded to a total flooded area of 30,305.15
26 hectares. By 2007, with rainfall dropping to 340.7 mm, the inundated surface declined to 27,090.14
27 hectares, marking a 10.6% reduction. This downward trend continued in 2013, when precipitation
28 further decreased to 304.8 mm, and the flooded area contracted significantly to 16,736.16 hectares, a
29 44.8% decrease over the 11-year period. This study investigates whether fluctuations in wintering
30 duck numbers are linked to both total wetland area and the extent of main habitat types. Population
31 counts from 2003, 2007 and 2013 were compared with temporal changes in open-water and
32 flood-prone surfaces, derived from satellite imagery and GIS analysis. The results indicated that,
33 besides the surface area of flooded zones being a key condition for supporting large numbers of
34 waterfowl, factors such as safety, the absence of disturbances and predators, and the availability of
35 food are also crucial in attracting these species.

36 **Keywords:** Wetlands, flooded area, precipitation, wintering ducks, remote sensing.

38 **1. Introduction**

39 Wetlands are dynamic and complex ecosystems that vary significantly across different regions and
40 climates. To effectively assess and monitor their status and trends, it is essential to obtain timely and
41 accurate information on their spatial and temporal characteristics (Luo *et al.* 2024). For a long time,
42 the Mediterranean wetlands have been damaged, or heavily regained, for agricultural purposes,

improvement of tourist areas and perceived health benefits (Parrinello and Bécot, 2019). During the last twenty years, the Mediterranean region has lost more than half of its wetlands (Bonnet *et al.* 2005; Taylor *et al.* 2021). Considered as a hot spot area (Adloff *et al.* 2015), Mediterranean wetlands and their biodiversity are in sharp decline in recent decades (Perennou *et al.* 2012) and their degradation is faster than that of any other ecosystem (Davidson, 2014).

Algeria ranks 4th in terms of wetland surface area among 27 Mediterranean countries (Taylor *et al.* 2021), and where its water resources are limited and depend on the influence of the climate (Touitou and Al-Aminb, 2020). In the last survey carried out by the General Direction of Forests, Algeria records 2,375 wetlands, 2,056 are natural and 319 are artificial including 50 wetlands of international importance (Ramsar, 2019). These wetlands play an important role in vital processes, maintaining hydrological cycles and housing an important flora and fauna (Gherzouli, 2013). They offer numerous invaluable services for ecosystems and society, e.g., controlling runoff, floods, erosion, and nutrient recycling, as well as providing people with food, animal fodder, raw materials, water for drinking and household use, and crop irrigation (Bougoffa *et al.* 2023).

The Sebkhât of Aures wetlands complex (SAWC) in northeastern of Algeria is one of the 16 wetland complexes that are important for the conservation of local and regional biodiversity (Boulkhssaim *et al.* 2009; Seddik *et al.* 2010; Bougoffa *et al.* 2023; Benzina *et al.* 2024). These habitats play a critical role as a wintering area for migratory birds and breeding area for rare and endangered species in the Palearctic and the world (Bouaguel, 2014; Benzina *et al.* 2022). Given its complex and variable climate, the SAWC plays a crucial role in shaping hydrological cycles, land use patterns and ecosystem functions. Therefore, most of these ecosystems are ephemeral and fill with water only for a short period of the year, often during winter (Houhamdi *et al.* 2009; Benzina *et al.* 2021). Despite their intermittency, they are recognized as winter habitats for surface ducks, waders and coots (Bougoudjil, 2016).

The use of satellite imagery for wetland inventories and monitoring offers a great potential because of repeated, homogeneous coverage of large areas (Dadaser-Celik *et al.* 2008; Ozesmi and Bauer,

2002; Rebelo *et al.* 2009; Rosenqvist *et al.* 2007). One of the primary reasons for monitoring Mediterranean wetlands, particularly in semi-arid regions, is to assess changes in habitat size and their impact on biodiversity. Among the species found in Mediterranean wetlands, a significant proportion is endemic, and many species listed as endangered rely on these natural wetland environments (MWO, 2012; Riservato *et al.* 2009).

RS (remote sensing) technology has become a robust asset for this purpose, offering extensive and high-resolution data on the distribution and types of wetlands. Nevertheless, current wetland RS products, mainly available at global or continental scales, face challenges in accurately capturing local variations and dynamics with high spatial and temporal resolution (Luo *et al.* 2024). Landsat data have been used in many studies on wetlands (Thomas *et al.* 2011), including the classification of wetlands (Berberoglu *et al.* 2004; Castaneda and Ducrot, 2009) and change detection (Baker *et al.* 2007; Kassawmar *et al.* 2011; Nielsen *et al.* 2008). Hence, the lack of remote sensing studies in our study area shows the urge of extensive remote sensing research.

This study aims to evaluate and monitor, for the first time, changes in the wetland areas of the SAWC during the reference years of 2003, 2007 and 2013, utilizing remote sensing and GIS technologies. Our objective is to compare these findings with the changes in duck populations, drawing on statistical data related to waterbirds. These findings provide essential scientific backing and create a strong foundation for decision-making in wetland conservation and management, aligning with the objectives of sustainable development.

2. Materials and methods

2.1. Overview of the study region

The SAWC is located in the Algerian northeastern highlands between 800 and 1200 m asl. It extends over 100.3 km (north to south) and 278 km (east to west), with an effective surface area of 16,020 km² and a perimeter of 942.3 km (DGF, 2016). This extensive area encompasses the whole watershed of the Constantinois high plateau (9,578 km²), and a significant portion of the Medjerda basin (7,870 km²) of its Algerian section, extending into Tunisia. The region is characterized by vegetation that is

95 resistant to salinity and drought (Bensizerara *et al.* 2013). The weather of the region is influenced by
 96 its location in an ecotone region, straddling between semi-arid and arid climate with humid variants
 97 in high altitude. The area suffers a long period of summer drought which dries out wetlands from
 98 May to November. Over the past 20 years, the mean of daily maximum temperatures ($\pm$ SD) was 36.9
 99 ± 2.04 °C, and minima were 8.94 ± 0.38 °C. Annual precipitation varies from year to year (160.8 to
 100 362.2 mm) with a very irregular seasonal distribution (Bougoffa *et al.* 2023).

101 The SAWC contains many natural wetlands (garaets, sebkhet and chotts) and artificial wetlands
 102 (dams, reservoirs, basins), that play a key role in wintering and breeding of many species of
 103 waterbirds during their migratory transit. The majority of which are shallow, ranging in size from a
 104 few hectares to hundreds of thousands of hectares (DGF, 2016).

105 This study focused on seven sites: Gareat El Taref, Gareat Guellif, Sebkhet Ezzmoul, Chott Tinsilt,
 106 Garaet Annk Djemel & El Merhsel, which are classified as Ramsar sites and are located in the
 107 administrative department of Oum el Bouaghi covering a total area of 44,250 ha. The other two sites
 108 Sebkhet Djendli and Koudiet Medaouar dam are located in Batna province, covering an area of 4,290
 109 ha. Location, land cover and general characteristics of the seven studied sites are provided in **Table**
 110 **1** and **Figure 1**.

111 **Table1.** General characteristics of the studied wetlands in the Sebkhet Aures wetlands complex
 112 (North-East of Algeria).

Name	International code *	Date of designation	Elevation(m) Area (ha)	Water salinity
Gareat El Taref	1DZ 034	12 December 2004	830 33460	Salt water
Garaet Guellif	1DZ 035	12 December 2004	890 24000	Salt water
Sebkhet Ezzmoul	1DZ 045	18 December 2009	800 6765	Salt water
Chott Tinsilt	1DZ 031	12 December 2004	792 2154	Brackish water
Garaet Annk Djemel & El Merhsel	1DZ 033	12 December 2004	844 18140	Brackish water
Sebkhet Djendli	-	Not classified	836 3700	Salt water

Koudiet Medaouar dam	-	Not classified	395 590	freshwater
-----------------------------	---	----------------	------------	------------

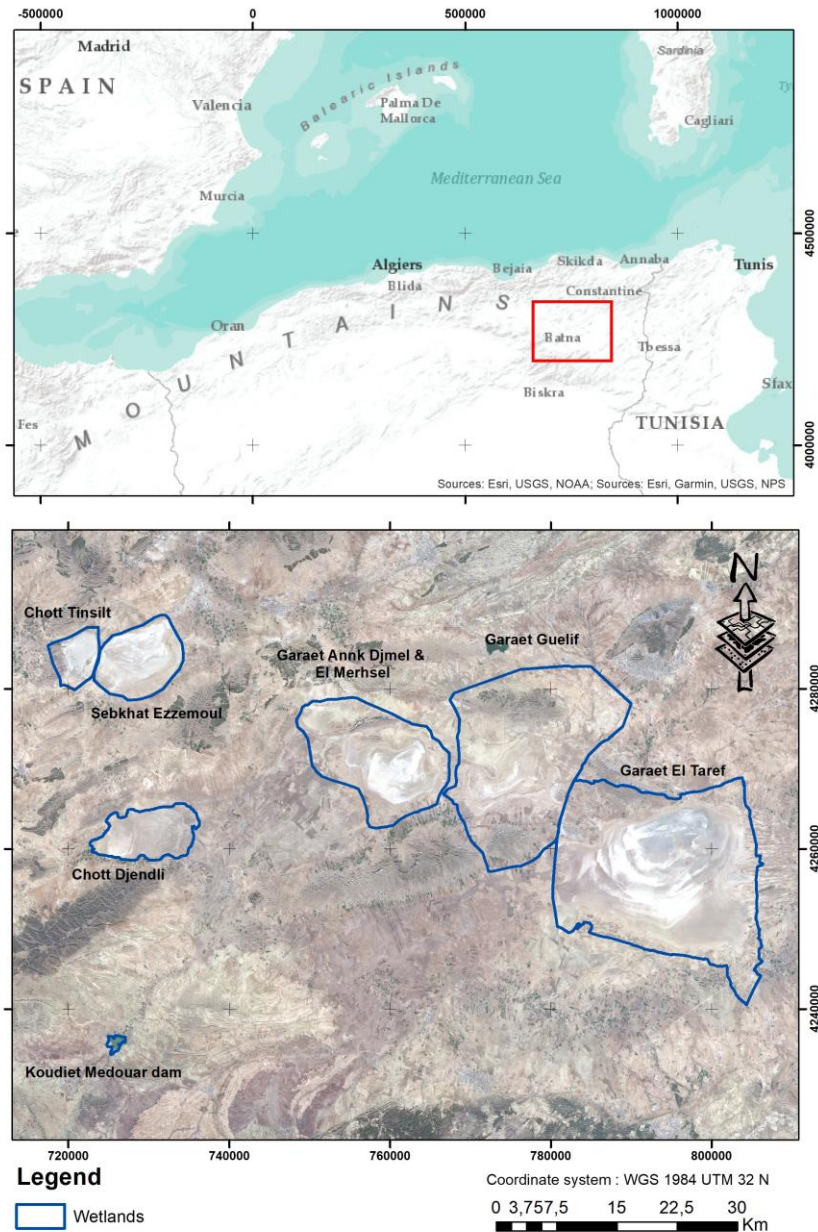


Figure 1. Location of the studied wetlands in the Sebkheth Aures wetlands complex (North-East of Algeria).

2.2. Data acquisition and processing

The spatiotemporal assessment of water surface was carried out using nineteen images sourced from the Landsat satellite (TM, ETM and OLI_TIRS). A Landsat TM image, which possesses a resolution of 30 meters, includes seasonal data from 2003, 2007 and 2013. Due to the issue of cloud cover: Satellite images are often disrupted by cloud cover, especially in wetlands where the climate is humid.

122 To ensure phenological continuity, two additional dates were added: December 2002, which is close
 123 to January 2003, and January 2014, which is close to December 2013. This minimizes seasonal
 124 variations and ensures complete spatial coverage for the analysis.

125 This information was acquired from Earth Explorer, a platform overseen by the United States
 126 Geological Survey (USGS) at <http://earthexplorer.usgs.gov/>, using the download tool to support our
 127 time series analysis. Our study area is located on a Landsat scene (path: 193, row: 35). Each image
 128 was visually rated for quality, and only cloudless images were chosen (**Table 2**).

129 **Table 2.** The Landsat images used and their characteristics*

Sensors	Platform	Path/Row	Acquisition date	Code image
ETM	LANDSAT 7	193/35	2002/12/10	a
ETM	LANDSAT 7	193/35	2003/02/25	b
ETM	LANDSAT 7	193/35	2003/05/03	c
ETM	LANDSAT 7	193/35	2003/06/28	d
ETM	LANDSAT 7	193/35	2003/07/30	e
ETM	LANDSAT 7	193/35	2003/10/02	f
TM	LANDSAT 5	193/35	2007/01/14	g
TM	LANDSAT 5	193/35	2007/03/19	h
TM	LANDSAT 5	193/35	2007/06/23	i
TM	LANDSAT 5	193/35	2007/08/31	j
TM	LANDSAT 5	193/35	2007/09/27	k
TM	LANDSAT 5	193/35	2007/10/16	l
OLI TIRS	LANDSAT 8	193/35	2013/05/06	m
OLI TIRS	LANDSAT 8	193/35	2013/06/07	n
OLI TIRS	LANDSAT 8	193/35	2013/07/25	o
OLI TIRS	LANDSAT 8	193/35	2013/09/11	p
OLI TIRS	LANDSAT 8	193/35	2013/10/29	q
OLI TIRS	LANDSAT 8	193/35	2013/12/16	r
OLI TIRS	LANDSAT 8	193/35	2014/01/01	s

130

131 2.3. Mapping the spatiotemporal dynamics of water surface

132 In order to delimit and highlight flooded areas, a thresholding treatment was performed for each
 133 image. This pretreatment was carried out from the Middle Infrared (MIR) channel, which reacts
 134 specifically in wetlands highlighting water surfaces and the vegetation with high water content. This
 135 treatment was performed by calculating the normalized difference of water index (NDWI) (Gao,
 136 1996).

137 The MIR channels of the spectral images acquired was treated in Arcgis 10 software in order to be
 138 reclassified with the pixel codes of the "water" class defined by thresholding. The reclassification

algorithm-processing module "Spatial Analyst" reclassify the extent of the threshold "water" as a new pixel value of 1. All other pixels were reclassified as value 0 corresponding to no water plots. The resulting image is characterized by a binary pixel coding: 0 for dry plots and 1 for wet plots. This image result was used to identify and delineate the flooded areas.

The sum of the various images that were reclassified earlier was assessed utilizing the Raster Calculator algorithm provided by this module. The pixel value of the image thus obtained after calculation corresponds to the sum of the pixel values of each image. The latter ranged from 0, indicating the absence of water pixels in any image, to N which represents the total number of pixels inundated across all analyzed dates. Here, N corresponds to the number of images analyzed; the regression model produced a map with a gradient of colors (Davranche *et al.* 2013).

2.4. Grouping of Anatidae and environmental factors

In our study we opted for the monitoring of Anatidae family over three winter seasons. Our observations conducted in mid-January during the years 2003, 2007, and 2014 indicated the presence of nine species : *Tadorna tadorna* (Belon shelduck), *Casarca ferruginae* (Shelduck casarca), *Anas platyrhynchos* (Mallard), *Anas penelope* (Whistling duck), *Anas clypeata* (Shoveler), *Anas acuta* (Northern pintail), *Anas crecca* (Winter teal), *Anas strepera* (Gadwall duck) and *Marmaronetta angustirostris* (Marbled teal).

To ascertain the relationship between duck numbers and the flooded areas of the studied wetlands, as well as their connection to environmental factors, we conducted analysis of variance. We studied the correlations between Anatidae numbers and several factors: (i) Environmental factors: Temperature (°C): for each date of each satellite image, we recorded the maximum temperatures (Tmax), minimum temperatures (Tmin), and average temperatures (T) for each considered month. Precipitation (mm): p1- precipitation from the two previous months, p2 - precipitation from the three previous months, and p3 - precipitation from the current month. (ii) Positioning factors: t. In order to conduct a thorough analysis of our study area, we took into account several essential positioning factors, including altitude (m), latitude (in degrees, minutes, and seconds) and longitude (in degrees, minutes, and

seconds). (iii) Surfaces of flooded areas: to assess the extent of flooding, we measured the areas that have been inundated with water during the studying periods. (iv) Yearly variation: to take into account fluctuations that may occur between the studied years.

2.5. Statistical analysis

Pearson correlations were calculated to examine the relationships between site area, total Anatidae population, and the different species recorded, in relation to the climatic and geographic parameters of the sites. The species abundance matrix across the various studied locations was analyzed using principal component analysis (PCA). A significance threshold of $P < 0.05$ was established, and the analyses were performed utilizing XLSTAT 2009.1.02 software.

3. Results and Discussion

3.1. Flooded areas

NDWI results can be presented in the form of maps and graphs, providing information on both spatial distribution of water bodies and their temporal evolution over longer periods. Flood maps illustrate variations that occur on a monthly and yearly basis. The analysis of flood-prone areas for each site conducted from December 10, 2002, to January 1, 2014, revealed considerable fluctuations in flood extent on various dates within the same year as well as across different years (**Figure 2**). The NDWI analysis were employed to determine the surface areas of each water body for the specified dates (**Table 3**). A significant drought was recorded in 2013, during which the sites experienced complete desiccation in the months of June, July and August.

Table 3. Changes in the total surface areas (ha) of the studied wetlands within the Sebkhet of Aures complex.

Date	Code	Garaet El Taref	Garaet Guellif	Sebkhet Ezzemoul & Chott Tinsillt	Annk Djemel & El Merhsel	Sebkhet Djendli	Dam Koudiet Medouar	Total (Ha)
2002.12.10	a	16155.44	3247.4	5092.4	4982.07	15513.36	0	44990.67
2003.02.25	b	15361.73	2663.97	3143.19	3808.63	1154.02	17.88	26149.43
2003.05.03	c	13639.22	4186.98	5965.73	16070.13	1999.56	241.44	42103.06
2003.06.28	d	7325.93	2322.87	5011.26	37155.58	1448.74	261.25	53525.63
2003.07.30	e	7050.71	934.64	4150.52	2500.66	1071.54	260.18	15708.07
2003.12.02	f	17846.71	4296.94	6536.03	6590.23	3847.53	574.82	39692.26
2007.01.14	g	5569.05	1254.98	2194.65	2351.24	10.26	605.49	11985.67
2007.03.19	h	11843.74	1588.87	3079.62	2823.93	53.22	611.58	20000.96

2007.06.23	i	0	0	1520.19	609.75	0	591.81	2721.75
2007.08.31	j	6973.13	1991.95	2791.44	15944.5	0	620.91	28321.93
2007.09.27	k	8211.05	0	2791.44	2047.87	747.49	638.12	14435.97
2007.10.16	l	11459.67	2750.31	3693.53	3356.74	92.81	604.63	21957.69
2013.05.06	m	0	0	0	0	0	340	340
2013.06.07	n	0	0	0	0	0	316.53	316.53
2013.07.25	o	0	0	0	0	0	278.61	278.61
2013.09.11	p	6172.85	1116.88	2374.46	1815.95	1125.15	295.63	12900.92
2013.10.29	q	4436.36	1604.5	1227.04	3111.56	551.6	247.32	11178.38
2013.12.16	r	3842.91	1617.82	1968.3	2631.56	1330.31	283.97	11674.87
2014.01.01	s	3647.88	1601.42	2141.97	2711.35	1913.72	299.15	12315.49

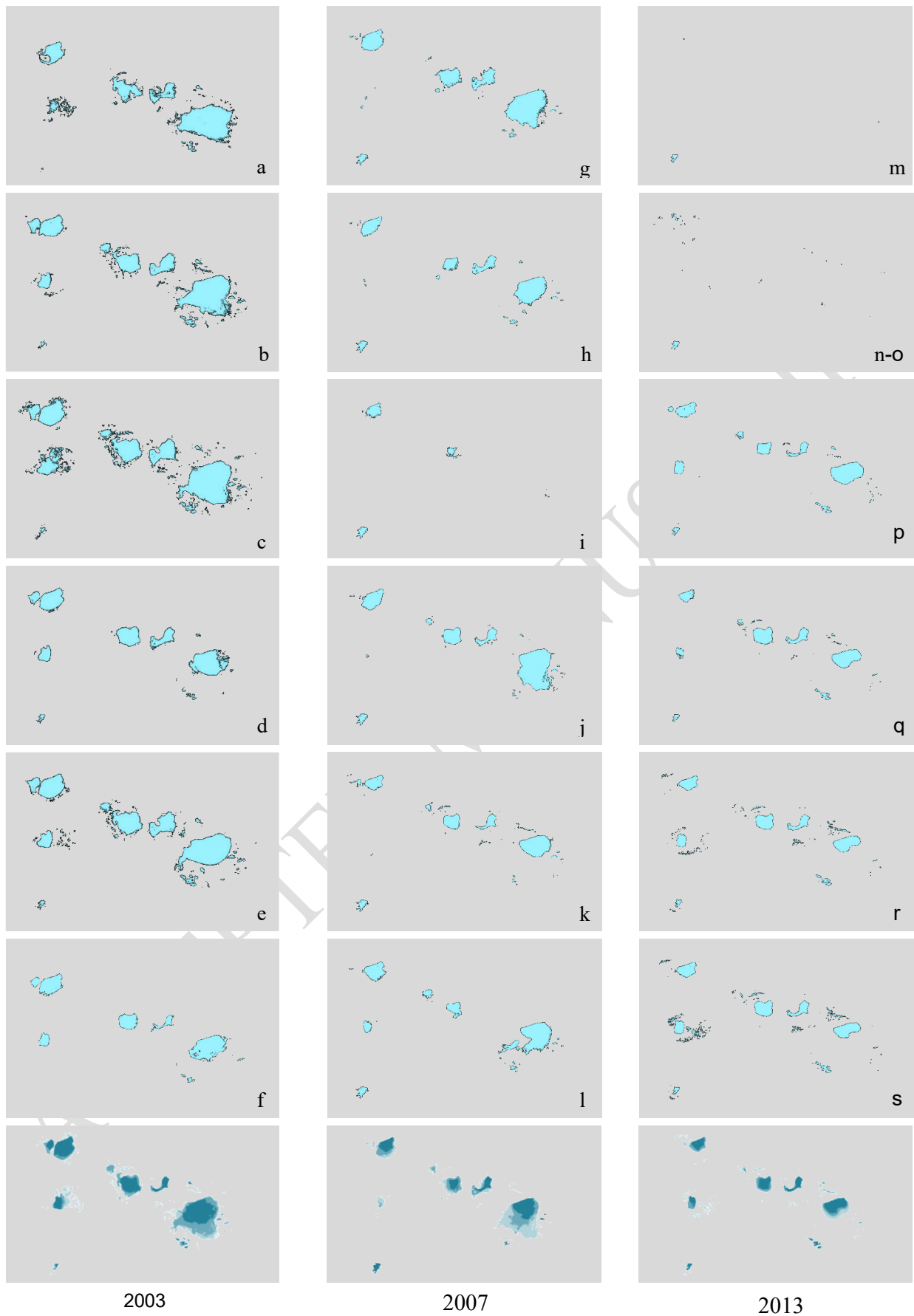


Figure 2. Flood maps along with intra-annual and inter-annual variations observed in the studied Sebket of Aures wetlands complex. (a – s : NDWI from October 12, 2002, to January 1, 2014).

190

191 This statement summarizes the observed fluctuations in wetland surface area across sites, years and
192 months and highlights the instances where the surface area is recorded as 0, potentially indicating
193 arid conditions. The wetlands exhibit significant variations in total areas over the years and across
194 seasons. The highest recorded total area was on 2002.12.10 (44990.67 ha), while the lowest was on
195 2013.07.25 (278.61 ha). This highlights a drastic decline in flooded areas over time. There is a marked
196 seasonal dynamic, with larger flooded areas during winter and spring (e.g., 2003.02.25 and
197 2003.12.02). Conversely, summer periods, such as 2003.07.30 or 2007.06.23, show significant
198 reductions in wetland areas, reflecting seasonal drying. The data from 2007 reveal a significant
199 reduction in areas compared to 2002 and 2003, potentially due to climatic (increased drought) or
200 anthropogenic factors (water extraction, urbanization). The years 2013 and 2014 show near-complete
201 drying of wetlands during May, June, and July (2013.05.06, 2013.06.07, 2013.07.25), highlighting a
202 severe deterioration in these ecosystems over the decade. When examining behavior of specific sites,
203 Garaet El Taref demonstrated extreme variations, with maximal areas recorded in 2002 and complete
204 drying in 2013. In addition, Sebkheth Djendli after peaks in 2002 and 2003, the flooded area
205 disappeared entirely in 2007 and 2013. Annk Djemel & El Merhsel recorded the maximum total area
206 of 37,155.58 ha by July 28, 2003 to a complete drying in June and July 2013. Other wetlands, such
207 as Garaet Guellif, Sebkheth Ezzemoul & Chott Tinsillt, have shown more gradual but still substantial
208 reductions. Despite its relatively small size, Dam Koudiet Medouar remained relatively stable even
209 in 2013, possibly due to specific hydrological management. Seasonal wetlands situated within arid
210 climates, such as chotts and sebkhas, present a distinctive challenge owing to their pronounced
211 hydrological variability (Wang *et al.* 2023, Labed *et al.* 2024). In these arid regions, precipitation
212 occurs sporadically and unpredictably, leading to erratic fluctuations in the extent of inundation
213 within these wetlands. These fluctuations can be attributed to the lack of precipitation and the increase
214 in temperatures (Meradi *et al.* 2024). Dawson *et al.* (2003) highlighted that variations in precipitation
215 and temperature play a crucial role in shaping physiological functions and have a significant impact

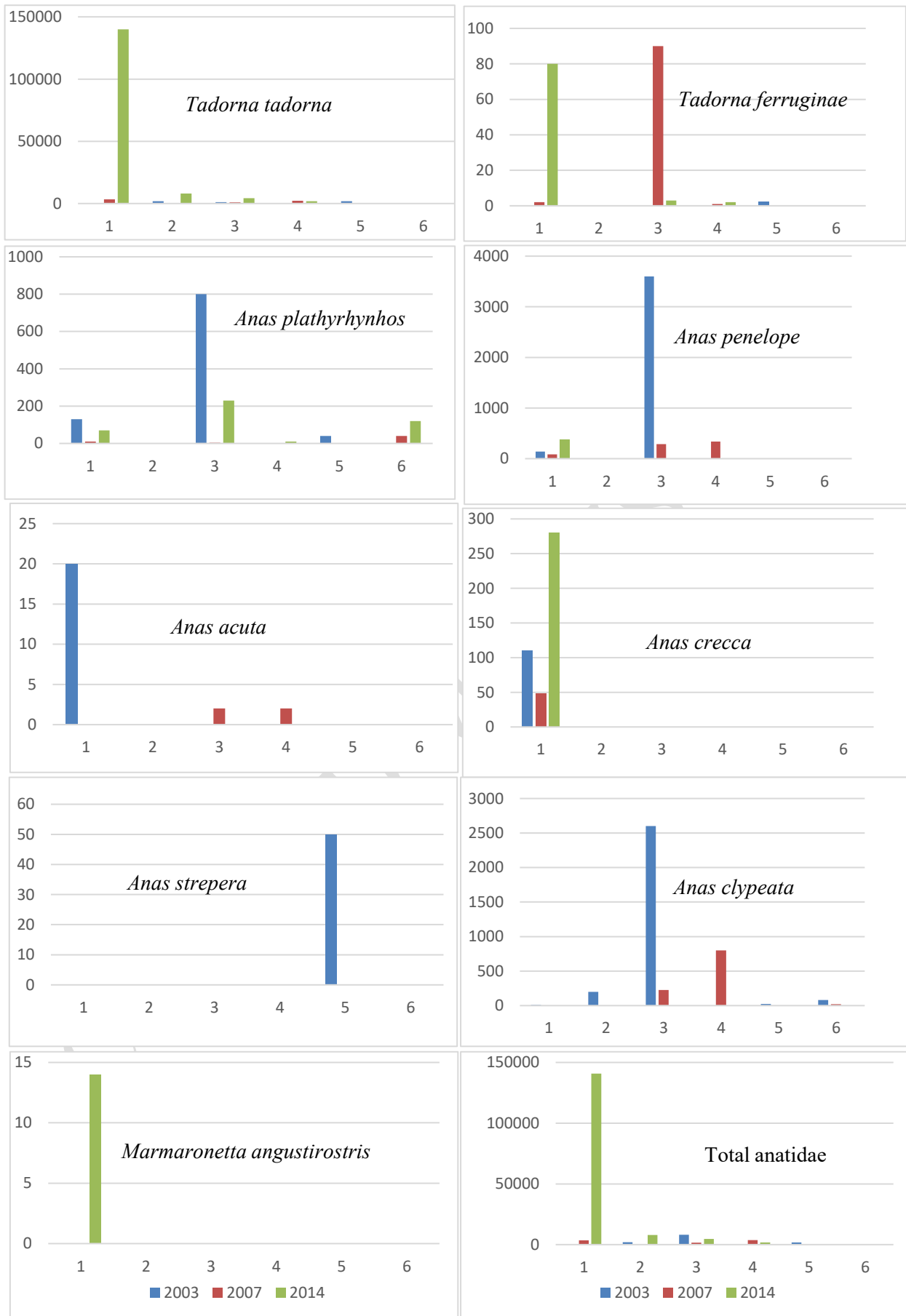
on wetlands. Temperature, in particular, is a key factor influencing the dynamics of wetland landscape patterns (Wang *et al.* 2023). Additionally, research has shown that fluctuations in precipitation and air temperature are the primary drivers of evapotranspiration variability. In fact, between the studied periods, Sebkhates of Aures wetland complex region experienced significant climate variability, particularly in terms of precipitation (Bentercia, 2022). In 2003, relatively high rainfall was recorded, especially during winter and spring, contributing to the expansion and stability of wetland areas. However, by 2007, a noticeable decline in precipitation, coupled with rising temperatures, led to drier conditions and a significant reduction in wetland surface areas, with some drying up completely during the summer months. The situation worsened in 2013, which was among the driest years, with extremely low rainfall and prolonged drought conditions. This resulted in a drastic shrinkage of wetlands, as high evaporation rates further exacerbated water loss. The accurate identification of long-term trends in wetland flooding is a crucial issue, especially considering the influence of climatic factors (Perennou *et al.* 2018) and the increasing anthropogenic pressures (e.g., MWO, 2012) on freshwater resources in arid regions. One method to address this challenge is to recognize that an assessment of flood regimes' trends necessitates the use of multiple seasonal maps spanning several years, such as the Global Surface Water (GSW) dataset produced by Pekel *et al.* in 2016, which covers a 32-year period from 1984.

3.2. Evolution of wintering anatidae populations

The wetlands of north-eastern Algeria are characterised by a great diversity of waterbirds. The inventory established in the 7 studied sites over three winter seasons, in mid-January of the three years (2003, 2007 and 2014) revealed the presence of nine species (**Figure 3**). The populations of wintering ducks vary from one year to another, from one species to another and from one site to another. 2014 showed the highest overall counts, particularly at Garaet El Taref, which hosted a large population of *Tadorna tadorna* (140,000 individuals) suggesting a shift in wintering preference and an improved habitat condition in that year. In addition, the dominance of this species suggests that the species may have adapted well to the environmental conditions of that year, potentially benefiting

from improved wetland conditions or reduced competition from other species. In contrast, 2003 recorded higher numbers for certain species such as *Anas platyrhynchos*, *Anas penelope*, and *Anas clypeata*, particularly at Sebkhet Ezzmoul and Chott Tinsilt. This suggests that the site provided favorable conditions for these species throughout that period. On the other hand, the decline of these species after 2003 could indicate a shift in migration patterns, possibly due to long-term climatic changes or habitat degradation. The year 2007 had generally lower counts across most sites and species, except for *Tadorna ferruginea* at Sebkhet Ezzmoul and Chott Tinsilt, indicating a potential shift in species distribution or environmental factors affecting the studied wetlands. Other sites (e.g., Sebkhet Djendli, Garaet Annk Djemel and El Merhsel, and Koudiet Medaouar Dam) showed relatively lower numbers across all years, possibly due to fluctuating water levels, habitat degradation, or changing migratory routes. The presence of *Marmaronetta angustirostris* in 2014 is ecologically significant, as this species is considered vulnerable in some regions.

The variation in the population of wintering Anatidae is primarily influenced by factors such as safety and food availability (Li *et al.* 2021). Ducks require protection from predators and human disturbances, as well as access to suitable food sources like aquatic plants, invertebrates, and grains, which are essential for their survival during the harsh winter months. Additionally, each species has specific habitat and ecological requirements. For instance, *Anas strepera*, *Anas acuta*, and *Anas penelope* are surface-feeding ducks, also known as dabbling ducks, which prefer shallow waters where they can easily access aquatic plants and micro-invertebrates. The size and typology of a site also affect the distribution of wintering ducks, with larger sites supporting higher numbers of ducks (Meng *et al.* 2019). This was evident in Garaet El Tarf, the largest site in our study area, which is particularly frequented by *Tadorna tadorna*, *Tadorna ferruginea*, and *Anas crecca*.



269 **Figure 3.** Evolution in the population counts of each wintering Anatidae species by site and year mid-
270 January of the three years (2003, 2007 and 2014). 1: Gareat El Taref, 2: Gareat Guellif, 3: Sebkhet
271 Ezzmoul & Chott Tinsilt, 4: Garaet Annk Djemel & El Merhsel, 5: Sebkhet Djendli, 6: Koudiet
272 Medaouar dam.

273 3.3. Relationship between the total areas, abundance of anatidae and ecological parameters

274 To examine the relationship between the number of wintering ducks surveyed and the surface area of
275 the water bodies, we chose to use Pearson's correlation coefficient to measure the strength of the
276 association between these factors (**Table 4**). Pearson's parametric correlations between site areas,
277 climatic and geographic variables on the one hand, and Anatidea numbers and the same climatic and
278 geographic variables on the other hand, showed overall weak, insignificant relationships ($P < 0.05$).
279 The analyses showed a significant negative correlation ($r = -0.518$) between surface area and
280 maximum temperature, indicating that as maximum temperature increases, site area decreases. A
281 positive correlation with P3 ($r = 0.391$) showed that higher precipitation in P3 is associated with a
282 larger surface area. Furthermore, the number of Anatidae exhibited a positive correlation with
283 longitude (0.485), indicating that the number of Anatidae increases as one moves east or west.
284 *Tadorna tadorna* exhibited a moderate positive correlation both with T max (0.461) and T mean
285 (0.405), suggesting that elevated maximum and mean temperatures may foster increased population
286 sizes of this species. *Anas acuta* demonstrated a particularly strong positive correlation with surface
287 area (0.853), a particularly strong positive correlation with the surface of the site (0.853), suggesting
288 that this species is more prevalent in larger areas. *Anas strepera* shows a positive correlation with P1
289 (mm) (0.535) and P2 (mm) (0.530), suggesting that this species thrives in areas with higher rainfall
290 during these periods. Other species, such as *Anas clypeata* and *Anas crecca*, show varying degrees of
291 correlation with other climatic parameters, indicating that their presence may be influenced by factors
292 like temperature and precipitation patterns.

293 **Table 4.** Values of the Pearson correlation between the surface of the site, the total number of
 294 Anatidae and the different species inventoried with the climatic and geographical parameters of the
 295 sites. Values in bold are significant ($P < 0.05$).

Variables	Surface	Altitude (m)	Longitude	Latitude	P1 (mm)	P2 (mm)	P3 (mm)	T max (°C)	T min (°C)	T average (°C)
Surface of the site	1	-0.175	0.186	0.366	-0.132	0.133	0.391	-0.518	0.331	-0.164
Anatidae	0.058	-0.111	0.485	-0.097	0.012	0.083	-0.169	-0.213	0.470	0.276
<i>Tadorna tadorna</i>	-0.091	-0.050	0.331	0.011	0.102	0.091	-0.384	-0.062	0.461	0.405
<i>T. ferruginae</i>	-0.062	0.017	0.189	0.135	0.104	-0.015	-0.331	0.179	0.258	0.411
<i>Anas platyrhynchos</i>	0.251	0.057	0.274	-0.105	-0.256	0.024	0.341	-0.379	0.043	-0.260
<i>Anas Penelope</i>	0.217	-0.070	0.339	-0.136	-0.129	0.022	0.246	-0.295	0.149	-0.119
<i>Anas clypeata</i>	0.152	-0.147	0.367	-0.239	-0.069	0.031	0.216	-0.226	0.163	-0.058
<i>Anas Acuta</i>	0.853	-0.002	-0.031	0.309	-0.112	0.019	0.241	-0.261	0.127	-0.115
<i>Anas crecca</i>	0.248	0.187	-0.321	0.365	-0.146	-0.214	-0.180	0.001	-0.035	0.052
<i>Anas strepera</i>	0.016	0.084	-0.012	0.306	0.535	0.530	0.221	-0.152	-0.020	-0.262
<i>Marmaronetta angustirostra</i>	0.009	0.050	-0.081	0.346	-0.044	0.006	-0.183	-0.087	0.159	0.113

296
 297 The analysis of the eigenvalue matrix reveals a noticeable decrease in their values after the second
 298 axis (F2). suggesting that F1 and F2 should be retained for further analysis. Together, they explain
 299 52.3% of the total variability, which is significantly more than the remaining axes (**Table 5**).
 300 Following the reasoning of Benzecri *et al.* (1973) and Wermuth (1976) in multidimensional analysis,
 301 where the complexity of the data and the results make it unlikely that any outcome derived from
 302 random fluctuations would be interpretable. We can confidently assert that the interpretable results
 303 are valid. Consequently, this analysis distinguishes two groups of species based on strong
 304 correlations: Group 1 includes *Marmaronetta angustirostra*, *Anas crecca* and *Tadorna ferruginae*,
 305 while Group 2 consists of *Anas penelope*, *Anas platyrhynchos* and *Anas clypeata*.

306 **Table 5.** Eigenvalues and inertia of the first 5 factorial axes.

	F1	F2	F3	F4	F5
Eigenvalue	2.909	2.325	1.238	1.124	0.900
Variability %	29.089	23.248	12.377	11.239	8.999
Cumulative %	29.089	52.338	64.715	75.954	84.953

307

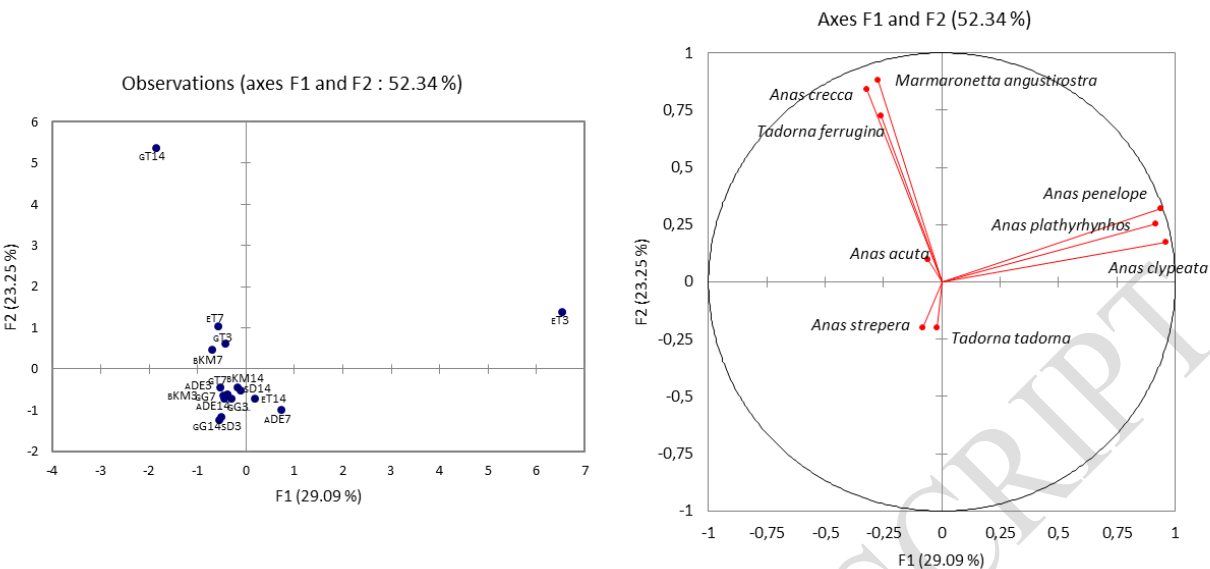


Figure 4. Principal Component Analysis (PCA) of Studied Wetland Sites and Inventoried Bird Species: Representation in the 1×2 Plane

However, contrasting trends are evident among different taxonomic groups. Waterbirds, for instance, have exhibited an average increase in population. This phenomenon can be attributed to three primary factors. Firstly, the intensive hunting of waterbirds in the past has led to a significant decline in their numbers and range, resulting in a low baseline for 1990. Secondly, the implementation of specific protection laws (e.g., the European Union Birds Directive) in conjunction with effective governance has resulted in a substantial increase in the number of breeding populations in certain countries, including the European Union. Thirdly, the presence of artificial water bodies has increased, and, in contrast to many other wetland species, these have provided additional habitat space for some water birds.

Understanding the relationship between species and their environment is crucial to studying their ecological requirements and spatial distribution. Anatidae usually inhabit diverse water bodies, like lakes, rivers, marshes and others, thriving on a diet that includes aquatic plants, algae, insects, fish, crustaceans, and other aquatic animals.

326 The principal component analysis (PCA) performed on species of the genera *Anas*, *Tadorna*, and
327 *Marmaronetta* reveals a clear structuring of individuals based on two main axes that together explain
328 52.34% of the total variance (**Figure 4**). This structuring reflects ecological, morphological, and
329 behavioral differences that are well documented in the scientific literature.

330 The first axis (F1: 29.09% of variance) appears to distinguish species based on foraging strategies
331 and habitat use. Species with high positive loadings on F1, such as *Anas clypeata*, *A. platyrhynchos*,
332 and *A. penelope*, share filtering or dabbling feeding behaviors, as reported by Johnsard (1960). These
333 species are typically associated with shallow wetland environments. Conversely, *Tadorna tadorna*
334 and *Anas strepera*, located on the negative end of F1, are known for broader, more generalist foraging
335 strategies and occupy more open habitats (Worthy and Lee, 2008).

336 The second axis (F2: 23.25%) likely reflects microhabitat preferences or reproductive behaviors. For
337 example, *Anas crecca* and *Tadorna ferruginea*, positioned in the upper part of the PCA plot, exhibit
338 high ecological plasticity and broad geographic ranges traits discussed in neuroecological terms by
339 Kalisińska (2005). The unique position of *Marmaronetta angustirostris* may highlight its rarity and
340 ecological specialization, as supported by paleontological and osteological studies (Zelenkov, 2024;
341 Haruda *et al.* 2024).

342 PCA results are consistent with molecular findings by Sun *et al.* (2017), who reported rapid and recent
343 diversification within the genus *Anas*, contrasting with the more conservative structure of *Tadorna*.
344 This reinforces the idea that the PCA not only reflects present-day ecological contrasts but also
345 evolutionary divergence patterns (Livezey, 1986; Livezey, 1991). Furthermore, the morphometric
346 proximity of some species on the PCA plot (e.g., *Anas platyrhynchos* and *A. clypeata*) aligns with
347 studies by Chernova *et al.* (2022), who demonstrated a strong correlation between macroscopic traits
348 (e.g., body size) and microscopic feather structure across Anseriformes.

349

350

351 4. Conclusion

352 This study demonstrates the effectiveness of remote sensing and spatial analysis in monitoring the
353 temporal evolution of wetland hydrology and its ecological implications. By delineating the Sebkhet
354 of Aurès Wetlands Complex (SAWC) and assessing surface water dynamics across a decadal
355 timescale, we revealed a strong correlation between precipitation patterns and the extent of flooded
356 areas. The significant reduction in inundated surface—from 30,305 ha in 2003 to 16,736 ha in 2013—
357 reflects the impact of declining rainfall and highlights the sensitivity of these wetlands to climatic
358 fluctuations. Furthermore, the analysis of Anatidae wintering populations suggests that hydrological
359 extent is a key determinant of waterfowl presence, although habitat quality—defined by factors such
360 as food availability, disturbance levels, and refuge conditions—plays a complementary role. These
361 findings underscore the need for integrated wetland management strategies that consider both
362 hydrometeorological variability and ecological functionality to support waterbird conservation in arid
363 and semi-arid landscapes.

365 Conflicts of interest

366 The authors declare no conflict of interest.

367
368 During the preparation of this work, the authors used ArcGIS by Esri in order to process and analyze
369 geospatial data and to generate the maps presented in this study, XLSTAT 2009.1.02 software in
370 order to perform statistical analysis of the data. The analyses were performed on a Lenovo laptop
371 equipped with an Intel Core i7 vPro 10th generation processor. After using these tools, the authors
372 reviewed and edited the content as needed and take full responsibility for the content of the
373 publication

378 **References**

379 Adloff F., Somot S., Sevault F., Jordà G., Aznar R., Déqué M. and Herrmann M., et al. (2015).
380 Mediterranean Sea response to climate change in an ensemble of twenty first century scenarios?
381 *Climate Dynamics*, 45, 9–10: 2775–2802.

382 Baker C., Lawrence R., Montagne C. and Patten D. (2007). Change detection of wetland ecosystems
383 using Landsat imagery and change vector analysis. *Wetlands*, 27, 610–619.

384 Bensizerara D., Chenchouni H., Si Bachir A. and Houhamdi M. (2013), Ecological status interactions
385 for assessing bird diversity in relation to a heterogeneous landscape structure, *Avian Biology*
386 *Research*, 6: 67–77.

387 Bentercia L. (2022), Atlas des zones humides classes Ramsar du complexe des Sebkhat des Aures
388 (Nord-Est Algérien). Dissertation, University of Batna 2, 35p.

389 Benzecri J.P. (1973), L'Analyse des Données. Tome 1: lA Taxinomie. Tome 2: L'Analyse des
390 Correspondances (2nd ED). Dunod, Paris

391 Benzina I., Si Bachir A., Santoul F. and Céréghino R. (2021), Macroinvertebrate functional trait
392 responses to environmental gradients and anthropogenic disturbance in arid-land streams of North
393 Africa. *Journal of Arid Environment*, 195, 104626.

394 Benzina I., Si Bachir A. and Perennou C. (2022), Waterbird diversity at the Sebkhet of Aures wetlands
395 complex, North East Algeria, *Der Ornithologische Beobachter*, 119, 318–329.

396 Benzina I., Si Bachir A., Arar A., Perennou C. and Guelmami A. (2024), Using DPSIR framework
397 for the implementation of wetlands observatory: case study Sebkhat of Aures wetlands complex
398 (Northerneast, Algeria), *Present Environment and Sustainable Development*, 18 (1), 293–309.

399 Berberoglu S., Yilmaz K.T. and Özkan C. (2004), Mapping and monitoring of coastal wetlands of
400 Çukurova Delta in the Eastern Mediterranean region, *Biodiversity and Conservation*, 13, 615–633.

401 Bonnet B., Aulong S., Goyet S., Lutz M. and Mathevet R. (2005), Integrated management of
 402 Mediterranean wetlands, 160 pp. *Conservation of Mediterranean Wetlands*, 13. Arles, Tour du
 403 Valat.

404 Bouaguel L. (2014), Structure et écologie des Phoenicoptéridés dans l'éco-complexe de zones
 405 humides de l'Est algérien. Doctoral thesis, University of Annaba, Algeria.

406 Bougoffa S., Benzina I., Telailia S. and Si Bachir A. (2023), Ecosystem services, vulnerability and
 407 threat levels of Ramsar wetlands in the complex of Aurès Sbkhates, North-Eastern Algeria.
 408 *Environmental & Socio-Economic studies*, 11 (2).

409 Bougoudjil S. (2016), Ecologie des *Tadornes casarca*, *Tadorna ferruginea* dans l'éco-complexe de
 410 zones humides des hautes plaines de l'Est algérien. Doctoral thesis, University of Annaba, Algeria.

411 Boulkhssaim M., Ouldjaoui A. and Baaziz N., et al., 2009. Mass reproduction of the Greater Flamingo
 412 at Ezzemoul, Algeria in 2009 the need to reassess the role of North African wetlands, *Flamingo*,
 413 17, 48–53.

414 Castaneda C. and Ducrot D. (2009), Land cover mapping of wetland areas in an agricultural landscape
 415 using SAR and Landsat imagery, *Journal of Environmental Management*, 90, 2270–2277.

416 Chernova E., Petrova N., Smirnov P. and Ivanov V. (2022), Migratory and wintering patterns of *Anas*
 417 *platyrhynchos* and *A. clypeata* in Eurasian wetlands, *Journal of Avian Biology*, 53(4), e02910.

418 Dadaser-Celik F., Bauer M.E., Brezonik P.L. and Stefan H.G. (2008), Changes in the Sultan marshes
 419 ecosystem (Turkey) in satellite images 1980–2003, *Wetlands*, 28, 852–865.

420 Davidson N.C. (2014), How much wetland has the world lost? Long-term and recent trends in global
 421 wetland area. CSIRO Publishing, *Marine and Freshwater Research*, 65, 10, 936–941.

422 Davranche A., Poulin B. and Lefebvre G. (2013), Mapping flooding regimes in Camargue wetlands
 423 using seasonal multispectral data, *Remote Sensing of Environment*, 138, 165–171.

424 Dawson T.P., Berry P.M. and Harrison P.A. (2003), SPECIES: a spatial evaluation of climate impact
 425 on the envelope of species, *Ecological Modelling*, 154, 289–300.

- 426 DGF. (2016), Stratégie nationale de gestion écosystémique des zones humides d'Algérie, Alger,
427 Algérie, 10p.
- 428 Gao B.C. (1996), NDWI- A Normalized Difference Water Index for Remote Sensing of Vegetation
429 Liquid Water from Space, *Remote Sensing of Environment*, 58, 257-266.
- 430 Gherzouli C. (2013), Anthropisation et dynamique des zones humides dans le nord-est-algérien:
431 apport des études palynologiques pour une gestion conservatoire. Thèse de doctorat Université
432 Toulouse le Mirail - Toulouse II, 2013. Français. (NNT: 2013TOU20128).
- 433 Haruda A., Mazzucato C. and Yeomans L. (2024), On the wing: Morphological variation in the
434 osteology of Mediterranean, Near Eastern, and European Anatidae (excluding Anserinae). *Journal*
435 *of Morphology*, 285(8), e21750.
- 436 Houhamdi M., Maazi M.C., Seddik S., Bouaguel L., Bougoudjil S., Saheb M. (2009), Statut et
437 écologie de l'Erismature à tête blanche (*Oxyura leucocephala*) dans les hauts plateaux de l'est de
438 l'Algérie, *Aves* 45 (2), 129–148.
- 439 Johnsgard P.A. (1960), A Quantitative Study of Sexual Behavior of Mallards and Black Ducks,
440 *Wilson Bulletin*, 72, 2.
- 441 Kalisińska E. (2005), Anseriform Brain and Its Parts versus Taxonomic and Ecological Categories.
442 Brain, *Behavior and Evolution*, 65(4), 244–261.
- 443 Kassawmar N.T., Rao K.R.M. and Abraha G.L. (2011), An integrated approach for spatio-temporal
444 variability analysis of wetlands: A case study of Abaya and Chamo lakes, Ethiopia. *Environmental*
445 *Monitoring and Assessment*, 180, 313–324.
- 446 Labed A., Si Bachir A., Benzina I., Ghazi C. and Chaibi R. (2024), Structure and seasonal distribution
447 patterns of phytoplankton in a natural mountain pond of the Belezma biosphere reserve (Northern
448 East Algeria), *Die Bodenkultur: Journal of Land Management, Food and Environment* 75(2), 77–
449 89.

Li X., Cheng R., Xiao W., Sun G., Ma T., Liu F., Liu X., Qian F. and Pan K. (2021), Assessment of the Suitability of Wintering Anatidae Habitats before and after Impoundment in the Three Gorges Reservoir Region, *Sustainability*, 13(9), 4743.

Livezey B.C. (1986), A phylogenetic analysis of Recent anseriform genera using morphological characters. *Auk* 103:737-754.

Livezey B.C. (1991), A phylogenetic analysis and classification of Recent dabbling ducks (tribe Anatini) based on comparative morphology. *Auk* 108:471-507.

Luo K., Samat A., Abuduwaili J. and Li W. (2024), Evaluation of Remote Sensing Products for Wetland Mapping in the Irtys River Basin, *Geosciences*, 14(1), 14.

Meng F., Li H. and Wang X. et al. (2019), Size matters: wintering ducks stay longer and use fewer habitats on largest Chinese lakes, *Avian Research*, 10, 27.

Meradi K., Bounar R., Benzina I., Meradi S., Si Bachir A. and Céréghino R. (2024), How do substrate types affect the seasonal richness and functional feeding groups variation of benthic insects in an arid region (northeastern Algeria)? *Biologia*, 79, 1749–1759.

MWO (Mediterranean Wetlands Observatory) (2012), Biodiversity—*status and trends of species in Mediterranean Wetlands*. MWO Thematic collection, 1. Tour du Valat Research Institute for the Conservation of Mediterranean Wetlands, Arles, France.

Nielsen E.M., Prince S.D. and Koeln G. T. (2008), Wetland change mapping for the US mid-Atlantic region using an outlier detection technique, *Remote Sensing of Environment*, 112, 4061–4074.

Ozesmi S.L., Bauer M.E. (2002), Satellite remote sensing of wetlands, *Wetlands Ecology and Management*, 10(5), 381–402.

Parrinello G., Bécot R. (2019), Regional planning and the environmental impact of coastal tourism: The mission racine for the redevelopment of Languedoc-Roussillon’s littoral, *Humanities*, 8, 1: 13.

Pekel J.F., Cottam A., Gorelick N. and Belward A.S. (2016), High-resolution mapping of global surface water and its long-term changes, *Nature*, 540 (7633), 418–422.

476 Perennou C., Beltrame C., Guelmami A., Tomàs V.P. and Caessteker P. (2012), Existing areas and
 477 past changes of wetland extent in the Mediterranean region: an overview, *Ecologia Mediterranea*,
 478 38, 2: 53–66.

479 Perennou C., Guelmami A., Paganini M., Philipson P., Poulin B., Strauch A., Tottrup C.,
 480 Truckenbrodt J. and Geijzendorffer I.R. (2018), Mapping Mediterranean Wetlands With Remote
 481 Sensing: A Good-Looking Map Is Not Always a Good Map, *Advances in Ecological Research*,
 482 58.

483 Ramsar. (2019), The list of wetlands of international importance. Ramsar website. Retrieved from
 484 <https://www.ramsar.org/sites/default/files/documents/library/sitelist.pdf>

485 Rebelo L.M., Finlayson C.M. and Nagabhatla N. (2009), Remote sensing and GIS for wetland
 486 inventory, mapping and change analysis, *Journal of Environmental Management*, 90, 2144–2153.

487 Riservato E., Boudot J.P., Ferreira S., Jovi M., Kalkman V.J., Schneider W., Samraoui B. and
 488 Cuttelod A. (2009). The Status and Distribution of Dragonflies of the Mediterranean Basin. IUCN,
 489 Gland, Switzerland/Malaga, Spain.

490 Rosenqvist A., Finlayson C.M., Lowry J. and Taylor D.M. (2007), The potential of spaceborne (L-
 491 band) radar to support wetland applications and the Ramsar Convention, *Aquatic Conservation:
 492 Marine and Freshwater Ecosystems*, 17, 229–244.

493 Seddik S., Maazi M.C., Hafid H., Saheb M., Mayache B. and Houhamdi M. (2010), Statut et écologie
 494 des peuplements Laro-Limicoles et Echassiers dans les zones humides des hauts plateaux de l’Est
 495 de l’Algérie, *Bulletin de l’Institut Scientifique de Rabat*, 32 (2), 111–118.

496 Taylor N.G., Grillas P. and Al Hreisha H. et al. (2021), The future for Mediterranean wetlands: 50
 497 key issues and 50 important conservation research questions, *Regional Environmental Change*,
 498 21, 33.

499 Thomas R.F., Kingsford R.T., Lu Y. and Hunter S.J. (2011), Landsat mapping of annual inundation
 500 (1979–2006) of the Macquarie Marshes in semi-arid Australia, *International Journal of Remote
 501 Sensing*, 32, 4545–4569.

- 502 Touitou M. and Al-Aminb A. (2020), Climate change and water resources in Algeria: vulnerability,
503 impact and adaptation strategy, *Economic and Environmental Studies*, 18, 45: 411–429.
- 504 Wang Y., Meili N. and Fatichi S. (2023), Evidence and controls of the acceleration of the hydrological
505 cycle over land, *Nature Communications*, 14(1), 281.
- 506 Wermuth N. (1976), Analogies between multiplicative models in contingency tables and covariance
507 selection. *Biometrics*, 32, p 95-108.
- 508 Worthy T.H. and Lee M.S.Y. (2008), Affinities of Miocene (19–16 Ma) waterfowl (Anatidae:
509 Manuherikia, Dunstanetta and Miotadorna) from the St Bathans Fauna, New Zealand,
510 *Palaeontology*, 51, 677–708.
- 511 Zelenkov N.V. (2024), Chapter 1. Comparative Osteology and Phylogeny of Quails and Allies
512 (Coturnicini), *Paleontological Journal*, 58, 1093–1106.

ACCEPTED MANUSCRIPT