

# Using an unmanned aerial vehicle (UAV) for lake management: ecological status, lake regime shift and stratification processes in a small Mediterranean karstic lake

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## ABSTRACT

### Using an unmanned aerial vehicle (UAV) for lake management: ecological status, lake regime shift and stratification processes in a small Mediterranean karstic lake

High-resolution remote sensing imagery by unmanned aerial vehicles (UAVs) has been used as a tool for the environmental management of natural resources. Monitoring programmes that evaluate the ecological status of water bodies according to the Water Framework Directive (WFD) involve significant costs and sampling efforts that can be reduced by using UAVs. UAV imagery was used to measure some metrics of the “macrophytes and phytobenthos” biological quality element (BQE), which is required to assess the ecological status of European lakes; e.g. the percentage cover of hydrophytes and helophytes. Eight UAV flights took place during an annual cycle (July 2016 to July 2017) in a small karstic lake located in southeast Spain. Limnological surveys of physicochemical (temperature, conductivity, dissolved oxygen, pH) and biological (pigments) parameters were simultaneously performed to correctly interpret the UAV images. For each flight performance, an orthomosaic of georeferenced RGB images was obtained, and the different features of interest were monitored and quantified by an automated identification and classification system (the LAIC software). The UAV images allowed us to not only evaluate the lake’s ecological status by measuring macrophyte metrics, but to also detect relevant ecological events for environmental management. A gradual burial process of charophyte meadows by the proliferation of periphytic cyanobacterial was detected in an early state by UAV images. Stratification processes, such as hypolimnetic sulphur bacteria blooms or metalimnetic white colloidal layers, were also observed by UAV imaging. We conclude that UAV imagery is a useful tool for environmental lake management.

**Key words:** macrophytes, charophytes, cyanobacteria, lake regime shift, purple sulphur bacteria, anoxia, hypolimnion

## RESUMEN

### Uso de un vehículo aéreo no tripulado (VANT) para la gestión de lagos: estado ecológico, cambio de régimen y procesos de estratificación en una pequeña laguna cársica mediterránea

La teledetección de alta resolución obtenida mediante vehículos aéreos no tripulados (VANTs), viene siendo utilizada como herramienta en la gestión de los recursos naturales. Los programas de seguimiento para evaluar el estado ecológico de las masas de agua según la Directiva Marco del Agua suelen implicar altos costes y esfuerzos de muestreo, que podrían reducirse utilizando VANTs. En el presente estudio, se han utilizado las imágenes obtenidas con VANTs para medir algunas métricas del elemento biológico “macrófitos y fitobentos” requeridas en la evaluación del estado ecológico de los lagos europeos, como son el porcentaje de cobertura de hidrófitos y helófitos. El estudio se llevó a cabo en un pequeño lago cársico del sureste de España, donde se realizaron un total de ocho vuelos durante un ciclo anual (julio de 2016 a julio 2017). Para interpretar correctamente las imágenes obtenidas con VANTs, simultáneamente se registraron algunos parámetros limnológicos físicoquímicos (temperatura, conductividad, oxígeno disuelto, pH) y biológicos (pigmentos). Para cada vuelo se obtuvo un ortomosaico

*de imágenes RGB georreferenciadas, y se identificaron y cuantificaron los diferentes elementos de interés mediante un sistema automático de identificación y clasificación. Las imágenes obtenidas permitieron no solo evaluar el estado ecológico del lago sino también detectar procesos ecológicos relevantes para la gestión del lago. Por ejemplo, se detectó en estado temprano un proceso de enterramiento de las praderas de carófitos por la proliferación de tapetes perifíticos de cianobacterias. Adicionalmente, se detectaron procesos de estratificación como la formación de blooms de bacterias púrpuras del azufre en el hipolimnion, o de capas coloidales de color blanco en el metalimnion. Se puede concluir que las imágenes obtenidas con VANTs pueden ser herramientas útiles en la gestión medioambiental de los lagos.*

**Palabras clave:** *macrófitos, carófitos, cianobacterias, cambio de régimen, bacterias púrpuras del azufre, anoxia, hipolimnion*

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## INTRODUCTION

On 23 October 2000, “Directive 2000/60/EC of the European Parliament and Council established a framework for Community action in the water policy field” or, in short, the EU Water Framework Directive (WFD) was published. It establishes how to evaluate the ecological status of water bodies by means of biological quality elements (BQEs), and the hydromorphological and physicochemical elements supporting biological elements. For lakes, four BQEs are proposed: phytoplankton, other aquatic flora (macrophytes and phytobenthos), benthic invertebrate fauna and fish fauna. Implementing the WFD requires developing methodologies and protocols to evaluate community composition and abundance. This requirement has promoted the use of UAV imagery to evaluate the different metrics needed to assess the ecological status of water bodies (e.g. Hunter *et al.*, 2010, Kubiak *et al.*, 2016, Venturi *et al.*, 2016, Rivas *et al.*, 2017). These studies agree with methodologies based on the notion that performing aerial flights, supported by reduced fieldwork, might decisively contribute to the assessment and monitoring of water body status.

The importance of submerged macrophytes, mainly vascular hydrophytes and macroalgae, for a good ecological status relies on their key functional role to stabilise and promote excellent environmental conditions in water bodies. Extensive submerged macrophyte growth is often associated with clear water conditions because they constraint nutrients on phytoplankton, increase zooplankton grazers, decrease sediment resuspension and possibly secrete allelopathic substances (Jeppesen 1998, Van der Berg *et al.*, 1998). Moreover,

submerged macrophytes are absolutely involved in nutrient cycling regulation, immobilization of waterborne pollutants and the provision of physical habitats for other aquatic biota (Krupska *et al.*, 2012, Scheffer *et al.*, 1993, Scheffer & Carpenter 2003, Scheffer & Jeppesen 2007). Macrophytes’ abundance and diversity are important indicators of the ecological status of shallow lakes and are widely used as metrics for site-condition monitoring (Hunter *et al.*, 2010). Furthermore, the elimination of submerged macrophytes usually leads to an ecological shift in shallow lakes from a clear water state to a turbid state (Scheffer *et al.*, 1993). Biotic and abiotic factors can be involved in this environmental shift through diverse mechanisms (Scheffer *et al.*, 2001).

Remote sensing imagery by UAVs has very quickly evolved in the last decade and is now a useful tool for environmental management, agriculture, river and lake basin planning, etc. (Zhang & Kovacs, 2012, Nex & Remondino, 2014, Koparan, 2016). The gradual reduction in the acquisition and exploitation costs of UAV platforms, along with the higher imagery resolution compared to the low or medium remote sensing platforms traditionally used as satellites (Jones & Gross, 2014), have made their use more widespread (Colomina & Molina, 2014). For example, studies like those by DeBell *et al.* (2016) and Koparan (2016) have focused on using UAV imagery for hydrological management and water body characterisation.

Many studies have been published about assessing river water body status using UAV imagery (Rhee *et al.*, 2017). They have addressed a variety of aspects, such as the hydromorphological characterisation of rivers (Rivas *et al.*, 2015,

2016, 2017, Woodget et al., 2017), riparian and aquatic vegetation (Husson et al., 2013, Ghazal et al., 2015) or algae blooms (Flynn & Chapra, 2014, Hu et al., 2015, Kudela et al., 2015). Satellite imagery is more widely used than UAV imagery, arguably because of the ease of data acquisition (downloading or purchasing instead of conducting full field campaigns), its historic availability, affordability, etc. (e.g. in Spain, Doña et al., 2014, Sòria-Perpinyà et al., 2019). Moreover, larger areas can be covered by low and medium remote sensing platforms, such as satellites, compared to UAVs because of the lower resolution employed. However, the spatial scale of satellite imagery can be insufficient for some limnological and vegetation applications. Therefore, applying the WFD to lakes has recently promoted studies that use spatial high-resolution remote sensing imagery by UAVs, albeit as preliminary approaches to assist limnological assessments (Rhee et al., 2017). Thus, some works have addressed a range of limnological aspects that are involved in ecological status using UAV imagery; for example, dynamics of helophytes (*Phragmites*) in lakes (Venturi et al., 2016, Meneses et al., 2018, Tóth, 2018), submerged macrophytes in shallow lakes (Hunter et al., 2010) or algae blooms in reservoirs

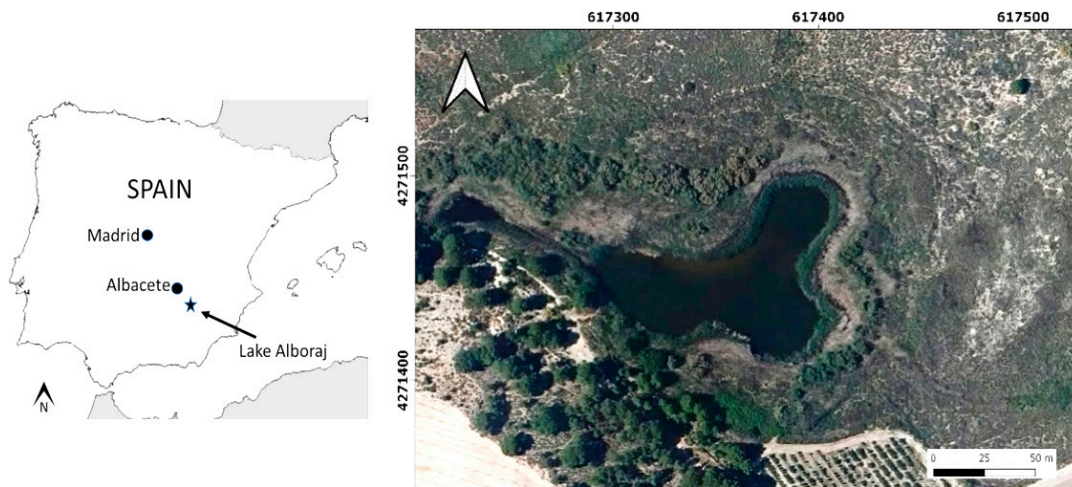
and lakes (Kubiak et al., 2016, Kageyama et al., 2018). Thus, combining aerial imagery with some limnological support provides a holistic approach to assess lake status.

In this work, we used UAV imagery to monitor and quantify aquatic vegetation cover to evaluate the ecological status of a small karstic lake. Additionally, UAV imagery detected some relevant ecological processes and events for lake environmental management and risk assessment purposes.

## MATERIALS AND METHODS

### Study area

Lake Alboraj is a permanent small karstic lake with a 3-hectare (ha) surface located in southeast Spain (Fig. 1). Currently, its water table extends 0.5 ha, although the water level fluctuates and very much depends on the precipitation regime. Nevertheless, the lateral groundwater inputs from a local shallow mio-plioquaternary aquifer with low-medium permeability materials (gypsum, conglomerates, sandstones, clayey limestones, tuffs and travertines) prevent drying ((IGME, 2009, CHS, 2016). The lake came about from a combination of tectonic and karstic processes



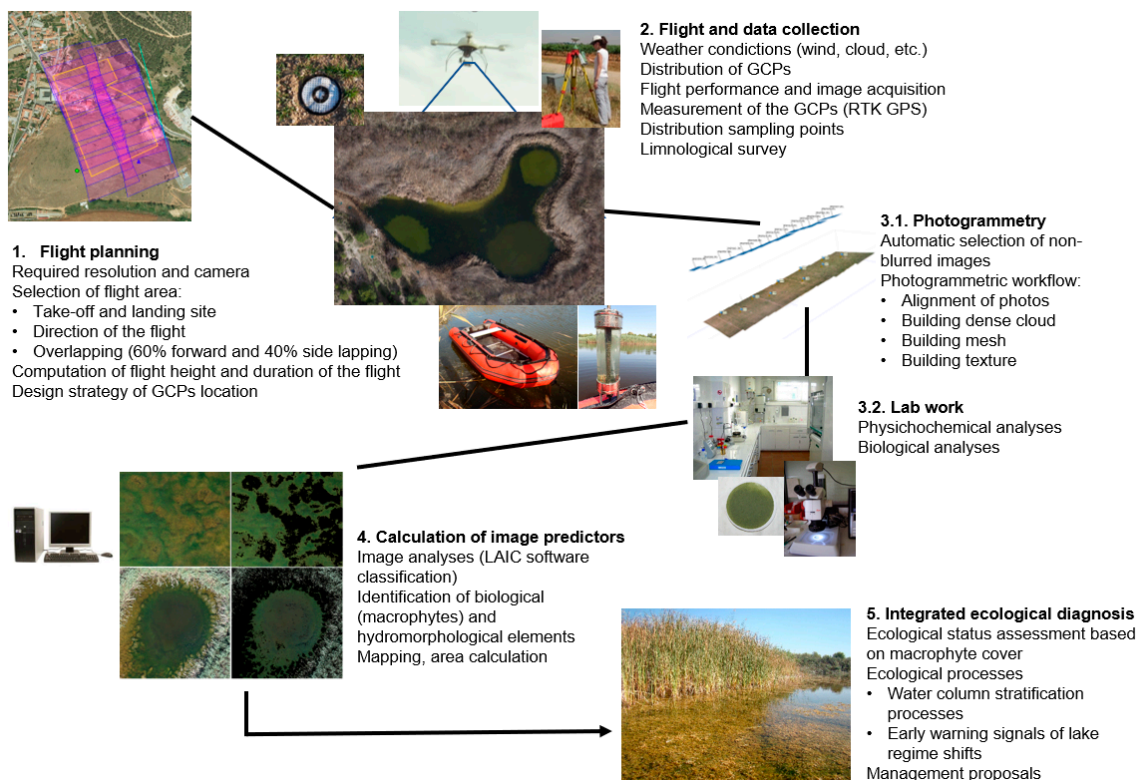
**Figure 1.** Geographical location of Lake Alboraj in southeast Spain. (image from 2018 PNOA flight, Instituto Geográfico Nacional, <http://fototeca.cnig.es>). Grid: EPSG: 25830-ETRS89/UTM zone 30N. *Localización geográfica de la Laguna de Alboraj en el sureste de España (imagen del vuelo PNOA 2018, Instituto Geográfico Nacional, <http://fototeca.cnig.es>). Reticula: EPSG: 25830-ETRS89/UTM zone 30N.*

**Table 1.** Ionic composition of the Lake Alboraj surface (1 m deep) water (31/08/2016). *Composición iónica del agua superficial (1 m) de la Laguna de Alboraj (31/08/2016).*

	mS/cm
Conductivity	11.5
Ionic composition	mg/l
HCO <sub>3</sub> <sup>-</sup> +CO <sub>3</sub> <sup>-2</sup>	132.0
SO <sub>4</sub> <sup>-2</sup>	7055.8
Cl <sup>-</sup>	1354.4
Ca <sup>+2</sup>	768.2
Mg <sup>+2</sup>	1126.0
Na <sup>+</sup>	550.7
K <sup>+</sup>	30.4

(Rodríguez-Pascua *et al.*, 2012, JCCM, 2015). The lake resembles shallow lakes, but its morphology includes three deep dolines where water column stratification occurs. The maximum depth in its deeper doline fluctuates between 4-6 metres. Shallow areas outside the dolines (interdoline area) are the available colonisable substratum for charophyte meadows (*Chara hispida*), whereas the bottom of dolines is devoid of charophytes. No water extraction or sewage discharges occur in this lake.

This lake has been classified as type 3190 Lakes of gypsum karst (Natural Habitat Types of Community Interest, Habitat Directive 92/43/EEC) (Camacho *et al.*, 2009) because it is on, and surrounded, by a gypsum-rich lithology. In line with the WFD, the lake is classified as national type “L-T15: Karstic, evaporites, hypogenic or mix, small”. Like other Spanish karstic lakes that



**Figure 2.** Flow chart including the main image acquisition and analysis phases followed to obtain the geomatic product. GCP, ground control point; RTK GPS, real-time kinematic global position system. *Proceso de adquisición de imágenes y fases de análisis seguidos para la obtención del producto geomático. GCP, punto de control; RTK GPS, sistema cinemático de posicionamiento global en tiempo real.*

come into contact with gypsum layers, the gypsum-rich substratum provides the lake water with a high sulphate concentration, which has a magnesium-sulphated ionic composition and high conductivity values ranging from 9 to 12 mS/cm (Table 1).

Lake Alboraj is located in a Special Area of Conservation (SAC) of the European Natura Network named “Saladares de Cordovilla y Agramón y Laguna de Alboraj” (code ES4210011). The main natural SAC values include singular halophytic flora, and highlight the local endemic of the SAC *Helianthemum polygonoides* (Cistaceae), which occurs in the lake’s immediate surroundings. The lake basin is in an agricultural landscape where eutrophication, salinisation and a lowering water level are the main anthropic impacts (Moreno et al., 2018). Submerged macrophytes, helophytes and phytoplankton produce organic matter that accumulates in sediments, whose decomposition promotes dystrophic characteristics (Valiente et al., 1997). The lake is surrounded by a reed belt of *Phragmites australis* and *Thypha dominguensis*, and the tamarisk *Tamarix canariensis* on the outer band.

### Obtaining high-resolution UAV images

Very high-resolution (2.5 centimetres) aerial images in the RGB (Red, Green, Blue) visible spectrum were collected. The employed platform was a quadcopter md4-1000 (Microdrones, Inc., Kreuztal, Germany), a 1.00-meter diameter (from rotor hub to rotor hub) quadcopter with a 0.224-kilogram embedded camera, a total payload capacity of 1.2 kg and a maximum take-off weight of 6 kg. This equipment tolerates wind gusts of 6 m/s. A Sony Alpha ILCE-5100 camera (Sony Corporation, Tokyo, Japan) with a 24.3 MPix resolution was employed. Figure 2 depicts the flow chart, including the main image acquisition and analysis phases followed to obtain a useful geomatic product for assessing macrophyte covers. From it, the ecological status was calculated.

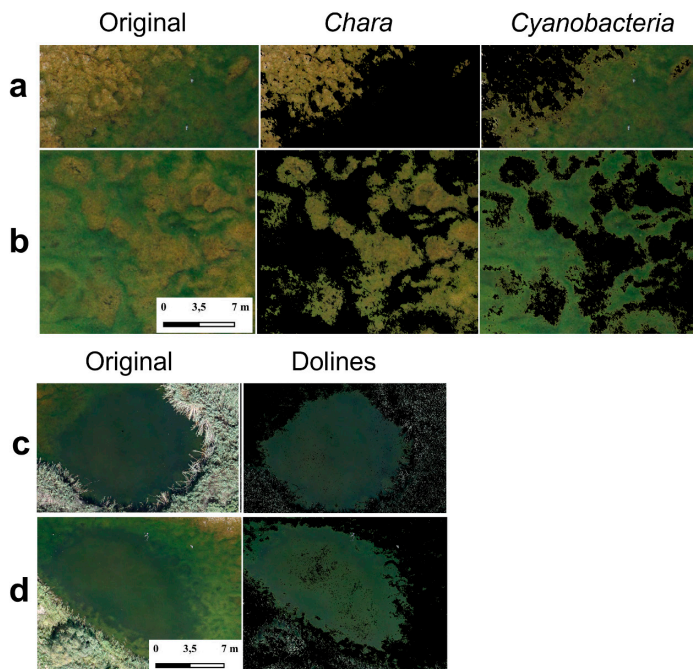
The ground sampling distance (GSD) was calculated to obtain a target imagery resolution of 2.5 cm based on the camera focal length by considering a maximum flight altitude of 120 m according to the regulatory airspace constraints in

Spain. Ten targets (radius of 0.20 m) were uniformly located and measured in the flight area to obtain the final geo-referenced images (orthoimages) (Ballesteros et al., 2018). The location of the targets’ centroids was measured by a Leica global position system (GPS) 1200 (Leica Geosystems AG, Heerbrugg, Switzerland) linked with a global navigation satellite system (GNSS) permanent reference station (ERGNSS, 2008). The estimated GNSS real-time kinematic (GNSS-RTK) system accuracy was 0.02 m for planimetry and 0.03 m for altimetry.

Flights and image processing were performed according to the methodology proposed by Córcoles et al. (2013) and Hernández-López et al. (2013). Eight UAV flights took place during an annual cycle, from July 2016 to July 2017. Flights started around solar noon to minimise solar glints and shading, and to optimise the water table and submerged vegetation visibility conditions, as well as maximum deep water column visibility. Image processing included the automatic selection of non-blurred images and the following photogrammetric workflow: alignment of photos, building dense cloud, building mesh, building texture. For each flight, an orthomosaic of the georeferenced RGB images was generated for the main purpose of quantifying the total macrophytes coverage in the lake.

### Interpreting UAV images

The areas covered by aquatic macrophytes were delimited using the Leaf Area Index Calculation (LAIC) classification software. The LAIC software is a MATLAB-based supervised artificial neural network (ANN) interface designed to discriminate green canopy cover from ground, shadows, and other background features by high-resolution UAV imagery (Córcoles et al., 2013). This software performed a cluster classification based on CIELAB characteristics. A k-means clustering algorithm of the RGB levels on the  $L^*a^*b^*$  colour-space transformed imagery was then implemented. The analysis groups pixels into k-clusters (k) with similar red/green (a) and yellow/blue (b) values. L (lightness) was not taken into account by the clustering algorithm. The number of clusters (k) depends on the feature being identified



**Figure 3.** Example of the class delineation of some features of interest obtained from the classification method (LAIC software). a) and b) Selection of *Chara* and *Cyanobacteria* from the original orthoimage obtained by high-resolution UAV imagery. c) Selection of the SE doline; d) Selection of the SW doline. Date of the original image: 26/07/2016 (Fig. 4). *Ejemplo de la delimitación de clases de algunos elementos de interés producido por el método de clasificación (LAIC). a) y b) Selección de Chara y Cyanobacteria a partir de la ortoimagen original obtenida por las imágenes de alta resolución captadas por VANTs. c) Selección de los límites de la dolina SE; d) Selección de los límites de la dolina SO.*

and was determined following an iterative process that increased  $k$  by one up to a maximum of ten clusters until visually satisfactory results were obtained. In this context, any visually satisfactory results required the image outputs to show that the feature of interest had been adequately identified. This supervised method was used to calibrate an artificial neural network (ANN) and the remaining images.

### Ecological status

In Spain, several metrics have been proposed in the Spanish protocol to evaluate the ecological status of lakes by means of the BQE “other aquatic flora” (macrophytes and phytobenthos) (MAGRAMA, 2013a, 2013b). We used UAV imagery to measure two main macrophyte metrics that are proposed in the Spanish protocol for lake type L-T15:

1) Hydrophyte cover (%). This metric assesses the cover percentage of type-characteristic hydrophytes on the colonisable substratum; that is, in zones where its settlement is possible. The characteristic hydrophyte species for type L-T15 are listed in the Spanish protocol (MAGRAMA 2013a). *Chara hispida*, the only hydrophyte species that inhabits the lake, is on that list. Examples of delimitation of the areas covered by *Chara hispida* by the LAIC classification software are shown in figure 3a and 3b. The total area covered by *Chara* corresponds to the absolute hydrophyte cover in the lake ( $m^2$ ). The cover percentage of hydrophytes is referred to as the “colonisable substratum” (according to the Spanish protocol, areas less than 2 m deep, slopes  $< 30\%$ , and non-rocky substratum) which, in the studied lake, corresponded to the whole shallow areas outside the three dolines (i.e. the interdoline area). The interdoline area was calculated by subtracting the

total area occupied by the three dolines from the total water table area. Examples of the doline areas delimited by the LAIC classification software are shown in figure 3c and 3d.

Cyanobacterial mats covered (buried) part of the charophyte meadows. The cover percentages of cyanobacterial mats were also measured in the same way as charophytes. Examples of the cyanobacterial mats delimited by the LAIC software classification are shown in figure 3a and 3b.

2) Helophyte cover (%). This metric assesses the cover percentage of type-characteristic helophytes on lake shores where its settlement is possible (MAGRAMA 2013a). With the studied lake, the whole lake’s perimeter was colonisable for the type-characteristic species *Phragmites australis* and *Thypha domingensis*. The UAV images verified that 100 % perimeter was colonised by helophytes on all the dates and, therefore, it was not necessary to use the LAIC software to calculate the value of this metric.

In order to calculate ecological status, the values obtained for the two metrics were compared to the reference values provided by national legislation (Table 2; MAGRAMA, 2015). The deviation of the metric values from the reference values set

out in national legislation was calculated by the Ecological Quality Ratio (EQR; European Communities, 2003): observed value/reference value, with values ranging from 0 (bad status) to 1 (high reference status). The EQR limit values among the five ecological status classes (high/good/moderate/poor/bad) were also obtained from national legislation (Table 2; MAGRAMA, 2015).

**Limnological assessment**

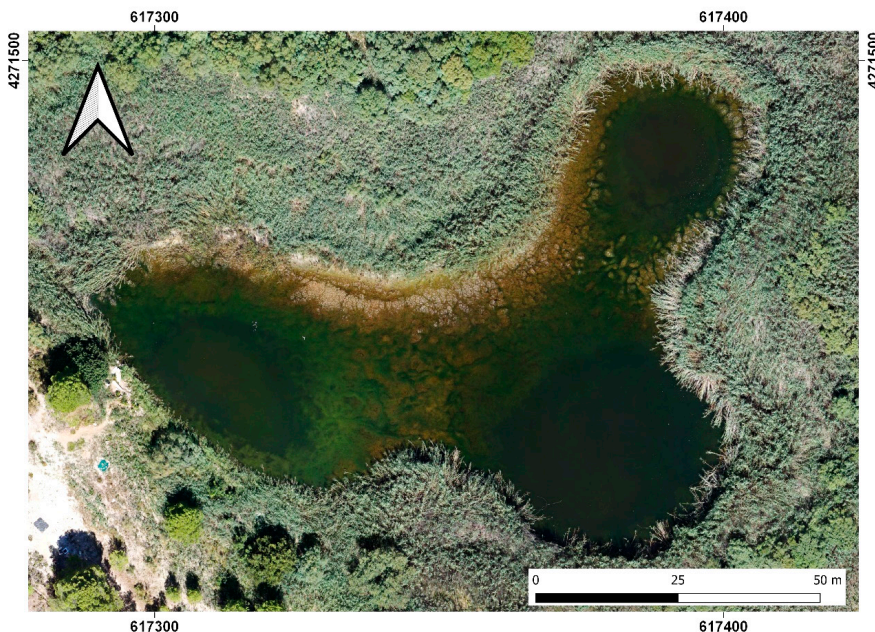
Sampling dates were chosen as closely to the flights as possible to correctly interpret the UAV orthoimages (Table 3). To validate the correspondence between submerged macrophytes and UAV images, field observations were made from a boat. At the beginning, halfway and at the end of the study period, a rake was used to extract charophytes from several points around the three dolines (two or three points per doline) for species confirmation. To establish a correspondence between images and the stratification features occurring in dolines, physicochemical and biological profilings were done from a boat at the deepest lake point (SE doline). Dissolved oxygen, water temperature, pH and conductivity were measured

**Table 2.** Reference values and the EQR (Ecological Quality Ratio) limit values between the ecological status classes for the two metrics addressed by UAV image processing (MAGRAMA 2015; lake type “L-T15: Karstic, evaporites, hypogenic or mix, small”). *Valores de referencia y de valores límite de EQR (Ratio de Calidad Ecológica) entre clases de estado ecológico para las dos métricas estimadas mediante el procesado de imágenes obtenidas con VANTs.*

Macrophyte metrics		
	Hydrophyte cover (%)	Helophyte cover (%)
Reference value	90	100
EQR High/Good	0.83	0.9
EQR Good/ Moderate	0.55	0.75
EQR Moderate/ Poor	0.28	0.3
EQR Poor/ Bad	0.01	0.1

**Table 3.** Flight and limnological sampling dates. *Fechas de los vuelos VANT y de los muestreos limnológicos.*

Flight dates	Sampling dates
26/07/2016	14/07/2016
23/08/2016	25/08/2016
05/10/2016	11/10/2016
27/10/2016	08/11/2016
22/02/2017	07/03/2017
10/05/2017	11/05/2017
22/06/2017	12/06/2017
12/07/2017	18/07/2017



**Figure 4.** The first high-resolution orthoimage obtained by the UAV imagery system (26/07/2016). Grid: EPSG: 25830-ETRS89/UTM zone 30N. At the bottom of the lake, brown corresponds to the submerged charophyte meadow and bright green denotes cyanobacterial mats. La primera ortoimagen de alta resolución obtenida a partir de las imágenes captadas por VANTs (26/07/2016). Respecto al fondo del lago, el color marrón corresponde a la pradera sumergida de carófitos y el verde brillante a tapetes de cianobacterias. Reticula: EPSG: 25830-ETRS89/UTM zone 30N.

at 0.5 metre-depth intervals using adequate probes (Hach HQd multiparametric portable meter). Water samples were taken with a Rüttner bottle at a 1 metre-depth interval for the pigment analyses to detect vertical phytoplankton stratification as a possible element to be captured by UAV images. Phytoplankton chlorophyll *a* and bacteriochlorophyll *a* were determined by filtering a big enough volume to obtain a coloured filter (between 200-1000 ml depending on the sample) through fibreglass filters (0.7  $\mu\text{m}$  pore size, 47 mm diameter) and using a vacuum pump. Filters were placed inside 15 ml screw-capped polypropylene tubes covered by aluminium foil and frozen at  $-20\text{ }^{\circ}\text{C}$  for 1 week to break algal cells. Pigment extraction was done in the same tube with the filter by adding 5 ml of 90 % acetone and leaving it in the fridge in the dark at  $4\text{ }^{\circ}\text{C}$  overnight. After performing spectrophotometric scanning (in semidarkness conditions) within the 350-850 nm range, chlorophyll *a* was calculated by the formula below (Jeffrey and Humphrey 1975):

$$\text{Chl } a \text{ (mg/m}^3\text{)} = [11.85(\text{A}664\text{-A}750) - 1.54(\text{A}647\text{-A}750) - 0.08(\text{A}630\text{-A}750)] \cdot v / V \cdot Z$$

where A630, A647, A664 and A750 are the absorbance values at the indicated wavelength; *v* is the volume of added acetone (ml); *V* is the volume of filtered water (L); *Z* is cuvette width (cm). The bacteriochlorophyll *a* concentration (measurement of the abundance of purple sulphur bacteria) was calculated by this formula (Tachibana & Ichimura, 1970):

$$\text{Bchl } a \text{ (mg/m}^3\text{)} = [25.2(\text{A}772\text{-A}830)] \cdot v / V \cdot Z$$

Observation and taxonomic approach of purple sulphur bacteria were addressed by a light microscope (Olympus BX50) equipped with a digital camera (Leica DFC420C). Water transparency was also measured at the profiling point (SE doline) with a Secchi disc. Additional chemical analyses of major ions were performed (Laboratorio Aguas de Albacete; certified municipal laboratory): alka-



**Table 4.** Ecological status calculated from the macrophyte metrics hydrophyte cover and the helophyte cover. The cover of cyanobacterial mats is also included in the first column. EQR: Ecological Quality Ratio (observed value/reference value; see Table 1 for the reference values and limit values of EQR between the ecological status classes). *Estado ecológico calculado a partir de las métricas cobertura de hidrófitos y cobertura de helófitos. En la primera columna también se incluye la cobertura de cianobacterias. EQR: Ratio de Calidad Ecológica (valor observado/valor de referencia; ver Tabla 1 para los valores de referencia y valores límite entre clases de estado ecológico).*

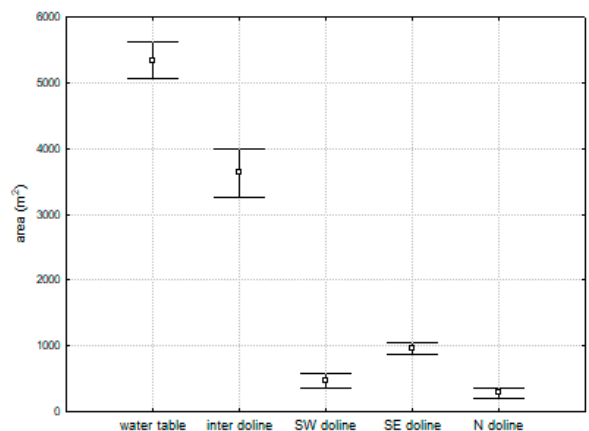
Dates	Hydrophytes			Helophytes			
	Cyanobacterial mats (%)	Hydrophyte cover (%)	EQR	Ecological status	Helophyte cover (%)	EQR	Ecological status
26/07/2016	72.4	27.6	0.31	Moderate	100	1	High
23/08/2016	63.9	23.6	0.26	Poor	100	1	High
05/10/2016	72.4	24.1	0.27	Poor	100	1	High
27/10/2016	76.6	20.7	0.23	Poor	100	1	High
22/02/2017	73.1	15.9	0.18	Poor	100	1	High
10/05/2017	83.8	9.0	0.10	Poor	100	1	High
22/06/2017	90.2	4.6	0.05	Poor	100	1	High
12/07/2017	90.6	4.6	0.05	Poor	100	1	High

linity by acid titration (precision  $\pm 0.1\%$ ); calcium and magnesium by flame atomic absorption spectrometry ( $\pm 19\%$ ); chloride and sulphate by ionic chromatography ( $\pm 5.9\%$ ); sodium and potassium by flame atomic emission spectrometry ( $\pm 11.7\%$ ). Redox potential was measured with a Hach Intellical MTC101 rugged probe coupled to a Hach HQd multiparametric portable meter. Sulphide ( $H_2S$ ) was measured with a Hach Hydrogen Sulphide Test Kit HS-WR (223801), which is based on the methylene blue method (precision 0.5 mg/l).

**RESULTS AND DISCUSSION**

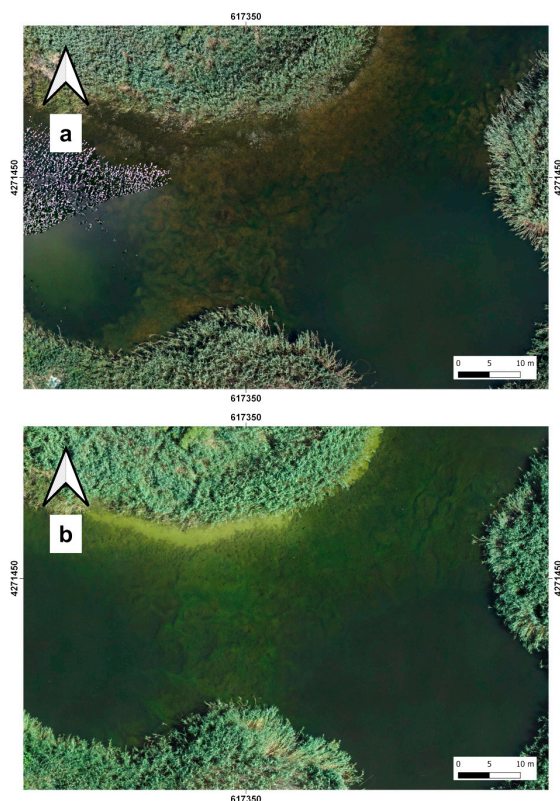
**Hydromorphological features**

The UAV images revealed the lake’s bathymetric characteristics, with the presence of three circular



**Figure 5.** Mean surface areas ( $m^2$ ) and standard errors of the selected hydromorphological features at Lake Alboraj during the study period ( $n = 8$ ). *Valores medios y desviación típica del área ( $m^2$ ) ocupada por los elementos hidromorfológicos medidos en la Laguna de Alboraj durante el período de estudio ( $n = 8$ ).*

dolines or sinkholes located to the north, south-west and southeast of the lake (Fig. 4). The SE doline obtained both the highest area and depth values, while the N doline was the smallest and



**Figure 6.** A comparison of the burial process of charophyte meadows by the cyanobacterial mats at Lake Alboraj at the beginning and the end of the study period. a) at the beginning of the study period (26/07/2016), 72.4 % of *Chara* meadow was covered by cyanobacterial mats, and 27.6 % of the *Chara* meadow remained free of cyanobacteria (see Table 4). b) at the end of the study period (12/07/2017), charophyte burial was almost complete with 90.6 % of the *Chara* meadow covered by cyanobacterial mats, and 4.6 % of the remaining *Chara* free of cyanobacteria. Brown corresponds to the charophyte meadow and green to cyanobacterial mats. *Comparación del proceso de enterramiento de las praderas de carófitos por los tapetes de cianobacterias en la Laguna de Alboraj, al principio y final del período de estudio. a) al principio (26/07/2016) el 72.4 % de la pradera de Chara estaba cubierta por tapetes de cianobacterias y el 27.6 % quedaba libre de tapetes (ver Tabla 4). b) al final del período de estudio (12/07/2017) el proceso de enterramiento era casi completo, con el 90.6 % de la pradera de Chara cubierta por tapetes de cianobacterias y el 4.6 % libre de cianobacterias. El color marrón corresponde a la pradera de carófitos y el verde a los tapetes de cianobacterias.*

shallowest. Although morphological features like dolines tended to logically remain constant on the study's time scale, slight interdate variation in the doline delimitation was recorded by the LAIC software classification. Conversely, the water table and interdoline area showed higher temporal variation due to seasonal water level fluctuation. The mean interdoline area value (the available substratum for charophytes) was 3 631.8 m<sup>2</sup>; i.e. 67.9 % of the water table (Fig. 4, 5).

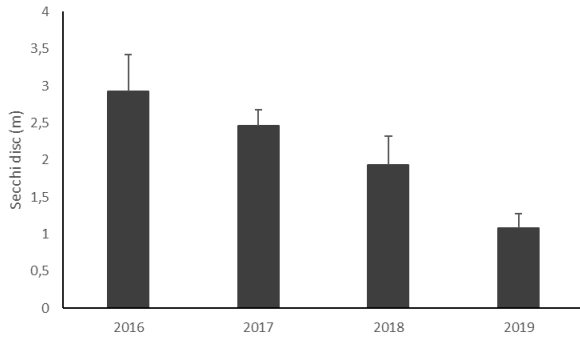
### Ecological status

In this study, UAV imagery was used to measure some features related to submerged aquatic macrophytes as a tool to evaluate ecological status. The ecological status classification based on the metric hydrophyte cover was "moderate" on the first date and remained "poor" for the rest of the study period (Table 4) due to cyanobacterial mats burying charophyte meadows. For lake type L-T15, an undisturbed-reference condition corresponding to a high ecological status was set by Spanish legislation at a value of 90 % on colonisable substratum (Table 2), whereas the hydrophyte cover was only 4.6 % at the end of the study period. Therefore, macrophyte communities deviated substantially from those normally associated with the surface water body type under undisturbed conditions (normative definition for a "poor" status; WFD, Annexe V).

As for the metric helophyte cover, the continuous perimetral red belt remained constant throughout the study period (100 % cover percentage of helophytes). Therefore, this metric classified the lake as a "high" ecological status (Table 4). When combining the results obtained by the two applied macrophyte metrics and, according to the criterion adopted by the WFD ("the worst status obtained by the applied metrics"), the ecological status was "moderate" in June 2016 and remained "poor" for the rest of the study period (Table 4).

### Burial of charophytes by cyanobacterial mats

The first high-resolution orthoimage of the Alboraj Lake obtained on 23 August 2016 (Fig. 4) clearly captured the extent of the cyanobacterial



**Figure 7.** Evolution of the mean and standard errors of the Secchi disc depth from 2016 to 2019 at Lake Alboraj. The burial of charophytes by cyanobacterial mats detected during the study period (July 2016 to July 2017) led the charophyte meadows to collapse and brought about a shift to a turbid alternative state at the lake from 2018 onwards (data taken after the study period). *Evolución de los valores medios y desviación típica de la profundidad del disco de Secchi de 2016 a 2019 en la Laguna de Alboraj. El enterramiento de carófitos por tapetes de cianobacterias detectado durante el periodo de estudio (julio 2016 a julio 2017) condujo al colapso de la pradera de carófitos y a un cambio de régimen hacia un estado turbido alternativo de la laguna a partir de 2018 (datos tomados fuera del periodo de estudio).*

mats over the charophyte meadow. During the study period, massive cyanobacterial mat growth took place and led to the almost complete burial of charophytes by the end of the study period in July 2017 (Fig. 6). As the cyanobacterial mats cover increased, the charophyte cover decreased, which affected ecological status (Table 4). The final consequence was death and the total elimination of the submerged vegetation in the whole lake from 2018 onwards, followed by the established alternative turbid state (observations after the study period). In the clear water state, the mean Secchi disc depth was around 3 m (in 2016), but it had gradually decreased to about 1 m in 2019 after charophytes died (Fig. 7; data from 2018 and 2019 taken after the study period). Therefore, apart from the ecological status evaluation, UAV imagery also proved to be a useful tool for detecting early warning signals of a forthcoming catastrophic shift with important lake conservation management implications.

Lake regime shifts are ecological processes



**Figure 8.** Summer anaerobic purple sulphur bacteria bloom at the bottom of dolines at Lake Alboraj (12/06/2017). Bottom-left, the pink water taken from anoxic hypolimnion (4 m deep) with a Rütner bottle sampler at Lake Alboraj. Bottom centre, the light microscope image of the purple sulphur bacteria (*Chromatiaceae*) responsible for the pink water colour. Bottom right, a fibreglass filter showing a pink-red colour (12/06/2017). Grid: EPSG: 25830-ETRS89/UTM zone 30N. *Bloom estival de bacterias púrpuras del azufre en el fondo de las dolinas en la Laguna de Alboraj (12/06/2017). Abajo a la izquierda, agua rosa tomada del hipolimnion anóxico (a 4 m de profundidad) con una botella Rütner. Abajo en el centro, imagen de microscopio de bacterias púrpuras del azufre (Chromatiaceae), responsables del color rosa del agua. Abajo a la izquierda, filtro de fibra de vidrio mostrando un color rojo-rosado (12/06/2017). Reticula: EPSG: 25830-ETRS89/UTM zone 30N.*

that have been well-reported in shallow lakes (Scheffer *et al.*, 1993, 2001, 2003). The events and environmental factors that induce these changes have been reported in other studies, and include killing fish, herbicides killing plants, zooplankton killed by pesticides or water level fluctuation (Scheffer *et al.*, 2001). At the studied lake, the shift was promoted by cyanobacterial mat overgrowth, which caused the burial and collapse of charophyte meadows. The end of the clear water charophyte state was followed by a shift to a turbid state from autumn 2018 onwards. The early warning signal (*i.e.* burial of charophytes by cyanobacterial mats) detected by UAV imagery in the clear water state precluded the undesirable dominance shift from the clear (dominated by submerged macrophytes) to the turbid state (dominated by phytoplankton) observed in later study period years.

The cause of cyanobacterial overgrowth could have been promoted by a eutrophication process that commenced in lake sediments, which accumulate high organic matter content from phytoplankton and macrophytes. Sediment organic

matter decomposition may lead to the release of nutrients (mainly phosphorous) to the water column (Blomqvist *et al.*, 2004, Conley *et al.*, 2009) which, in turn, could cause lake eutrophication and cyanobacterial overgrowth (Westman *et al.*, 2003, Havens *et al.*, 2001). Released nutrients could also have been facilitated by bioturbation of sediments by carps (*Cyprinus carpio*) (Moreno *et al.*, 2018).

#### Stratification processes detected by UAV imagery

On some dates, images showed a reddish colour at the bottom of dolines (Fig 8). The water column depth profile obtained in June 2017 revealed physicochemical and biological stratification (Table 5). An oxycline located between 2.5 and 3.5 m split an aerobic epilimnion from a colder and denser anaerobic hypolimnion. The water samples taken immediately below the oxycline at a depth of 4 m in the SE doline displayed a pink colour that corresponded to the reddish colour recorded in the UAV orthoimage (Fig. 8). The pink water presented a strong smell of hydrogen sulphide, and the presence of purple sulphur bacteria was

**Table 5.** Summer physicochemical and biological stratification of the water column in the SE doline of Lake Alboraj (12/06/2017). *Estratificación físico-química y biológica estival de la columna de agua en la dolina SE de la Laguna de Alboraj (12/06/2017).*

Depth	O <sub>2</sub> (mg/l)	O <sub>2</sub> (%)	Temperature (°C)	Conductivity (mS/cm)	pH	Chl <i>a</i> (mg/m <sup>3</sup> )	Bchl <i>a</i> (mg/m <sup>3</sup> )
0.5	2.7	34.8	24.6	9.9	7.36	-	-
1.0	2.6	33.2	24.5	9.9	7.37	3.2	2.4
1.5	2.5	31.5	24.4	9.9	7.38	-	-
2.0	2.5	31.6	24.3	9.9	7.44	3.7	1.7
2.5	2.1	27.2	24.3	9.9	7.42	-	-
3.0	1.6	20	24.2	10.0	7.44	5.4	6.5
3.5	0.3	4.3	24.1	9.9	7.36	-	-
4.0	0.1	1.3	21.4	10.6	7.01	28.7	482.6
4.5	0.1	1.1	18.3	11.2	7.03	-	-

confirmed in the laboratory by several ways. The light microscopy (Fig. 7) of live samples revealed the presence of abundant motile bacteria with intracellular sulphur globules and without gas vesicles, which included the typical features of the family *Chromatiaceae*; i.e. purple sulphur bacteria (Trüper & Pfennig, 1981, Häusler, 1982, Pfennig and Trüper, 1989, Imhoff, 2005). The most abundant cells were ovoid to spherical shaped (size: 3–4  $\mu\text{m}$  wide and 3–6  $\mu\text{m}$  long), and often diplococcus-shaped, before cell division, motile by flagella, occurring singly or in pairs, with intracellular highly refractile sulphur globules, mainly peripheral (Fig. 7). These morphological features might correspond to some species of the genus *Thiocystis* according to Bergey's Manual of Systematic Bacteriology (Imhoff, 2005), but this study included no genetical or physiological analyses. A high bacteriochlorophyll *a* concentration (482.6  $\text{mg}/\text{m}^3$ ) in the 4 metre-deep water sample with the typical absorption peak at 772 nm in acetone extract (Tachahasi & Ichimura, 1970) also confirmed the purple sulphur bacteria bloom (Table 5). A similar bacteriochlorophyll *a* concentration corresponding to purple sulphur bacterial layers has been recorded in other studies from Spanish karstic sulphated lakes (Guerrero et al., 1985, Vicente et al., 1991).

The presence of sulphate is important because it usually results in sulphate reduction by bacteria (*Desulfovibrio*-like) and, consequently, in sulphide production at lower lake layers (Guerrero & Pedrós-Alió, 1992). This sulphide provides phototrophic sulphur bacteria with reducing power and allows them to develop if enough light reaches anaerobic waters (Miracle et al., 1992). In this context, several karstic sulphated lakes in which purple sulphur bacteria were present have been studied in Spain; for example, small lakes in the Lake Banyoles complex (NE Spain, Girona) or Lake Arcas-2 (SE Spain, Cuenca). Their sulphate concentration was around 1000–2000  $\text{mg}/\text{l}$  with conductivity values ca. 2  $\text{mS}/\text{cm}$  (Miracle et al., 1992), while Lake Alboraj had a higher sulphate concentration, at around 7000  $\text{mg}/\text{l}$ , and a higher range of conductivity values of 9–12  $\text{mS}/\text{cm}$  (Table 1; Table 5). This high sulphate concentration favours the presence of phototrophic sulphur bacteria, which usually concentrate below the oxy-

gen-sulphide interface or the redoxcline (Vicente et al., 1991, Guerrero & Pedrós-Alió, 1992).

High sulphate concentration and reducing conditions on the anaerobic hypolimnion are key factors for  $\text{H}_2\text{S}$  availability and, therefore, purple sulphur bacteria development (Vicente et al., 1991, Guerrero & Pedrós-Alió, 1992). These conditions are well reflected by the oxygen gradient recorded in the depth profile in June 2017, but also by the pH gradient, which lowered from 7.36 on the epilimnion to 7.03 on the hypolimnion (Table 5). The lowering pH on the hypolimnion could mainly be due to the accumulation of  $\text{H}_2\text{S}$ ,  $\text{CO}_2$  and organic acids (Camacho, 1997). Redox potential Eh was not measured at that time, but the later measurements taken at the Lake Alboraj beyond the study period under the same stratification conditions (June 2019; unpublished data) ranged from + 70.7 mV on the epilimnion to -375 mV in hypolimnetic waters. These are optimal reducing conditions for purple sulphur bacteria. Likewise, several  $\text{H}_2\text{S}$  measurements on the hy-

**Table 6.** Depth profile of dissolved oxygen ( $\text{mg}/\text{l}$ ) in the winter stratification. White colloidal layers were detected on the oxycline (metalimnion) at 1.5 m and 2.5 m on 26/01/2017 and 07/03/2017, respectively. *Perfil de oxígeno disuelto ( $\text{mg}/\text{l}$ ) en la estratificación invernal. Se detectaron capas blancas coloidales en la oxiclina (metalimnion) a 1.5 y 2.5 m, el 26/01/2017 y el 07/03/2017 respectivamente.*

Depth	Dissolved oxygen ( $\text{mg}/\text{l}$ )	
	26/01/2017	07/03/2017
0.5	12.97	9.18
1.0	13.14	9.17
1.5	0.35	7.19
2.0	0.18	2.07
2.5	0.11	3.79
3.0	0.11	0.12
3.5	0.1	0.09
4.0	0.1	0.08
4.5	0.08	0.09

polimnion were taken beyond the study period (July 2018) under similar stratification conditions using a field sulphide kit (Häch), which gave concentration values of 50-60 mg/l  $\text{H}_2\text{S}$ . These values are in accordance with those obtained in other Spanish karstic sulphated lakes where purple sulphur bacteria abound (Miracle *et al.*, 1992).

Another stratification process, related to the anaerobic hypolimnion, was detected by UAV imagery and captured in winter (February 2017). The lake orthoimage showed a white colour in the centre of dolines where stratification occurred (Fig. 9). The water samples taken from the boat in the SE doline indicated a white colloidal layer that was about 0.5 m thick exactly on the oxycline (metalimnion), which moved between 1.5-2.5 m in winter (Table 6). No analyses were run in this study to identify this layer's chemical composition. However, the hypothesis of the white colour possibly corresponding to the concentration of elemental sulphur and other sulphur products (thio-sulphates, polysulphides) produced by sulphide

oxidation can be argued (e.g. Verhoeven, 2009, Duranceau *et al.*, 2010), mainly the oxidation of  $\text{H}_2\text{S}$  released from sediment. As in other Spanish karstic sulphated lakes, sulphide oxidation leads to the accumulation of colloidal elemental sulphur (Guerrero *et al.*, 1980, Vicente *et al.*, 1991). In marine environments (with a much lower sulphate concentration than that in the studied lake), extensive areas affected by this phenomenon have been detected by satellite images and are known as “white-water” events (Ferdelman *et al.*, 1999, Weeks *et al.*, 2002, Brüchert *et al.*, 2006, Ohde *et al.*, 2007). Further research is necessary to corroborate this hypothesis as to the origin of this metalimnetic white layer in the studied lake.

Another aspect to bear in mind from the management point of view is that sulphide ( $\text{H}_2\text{S}$ ) is a well-known lethal toxic gas for many organisms like fish (Bagarinao, 1992). Indeed, former massive fish deaths have been previously reported at Lake Alboraj (Moreno *et al.*, 2018). Therefore, the early detection of stratification processes (i.e.



**Figure 9.** Winter image of Lake Alboraj obtained by UAV (22/02/2017). The three dolines show a light-green colour due to the presence of a white colloidal layer located on the oxycline (see Table 6). Grid: EPSG: 25830-ETRS89/UTM zone 30N. *Imagen invernal de la Laguna de Alboraj obtenida con drones (22/02/2017). Las tres dolinas muestran un color verde claro debido a la presencia de una capa blanca coloidal localizada en la oxiclina (ver Tabla 6). Reticula: EPSG: 25830-ETRS89/UTM zone 30N.*

deep pink and white layers) by UAV imagery could be used as an early warning tool to make risk assessments of emergent anoxic conditions.

### Advantages of applying UAV

In this study, eight high-resolution UAV imagery sessions equipped with an RGB camera (GSD of 2.5 cm) allowed some ecological condition aspects to be characterised in a small lake covering 0.5 ha. The temporal evolution of macrophyte beds for several months and other biological processes were successfully detected by the proposed methodology. Other authors have successfully monitored and analysed aquatic vegetation using a GSD of 2.5 cm for RGB images with similar results to those herein reported for the method's validity (Kageyama et al., 2018, Chabot et al., 2018). High-resolution imagery using the LAIC software classification and ANN allowed the whole lake to be analysed and can be applied to bigger lakes, although the coverage abilities and temporal requirements for large-scale data collection, costs or data storage abilities should be considered for big lakes. Although LAIC software was originally applied to agricultural fields, this software is also suited to aquatic environments: for example, Rivas et al. (2015) obtained high accuracy (more than 81 %) performing high resolution imagery classification by using LAIC software in rivers.

The quantification of biological quality elements (abundance, cover) is a key issue for evaluating the ecological status of water bodies according to the WFD. The cover percentage of submerged macrophytes, specifically the extent of charophyte meadows, was efficiently quantified in this study from the orthoimages obtained by UAV imagery. Field macrophyte surveys include traditional sampling methods, such as transects, plots, the use of bathyscopes, Ekman grabs, or subaquatic surveys, which require investing many sampling efforts (Hunter et al., 2010). In Spanish lakes, national protocols require 10 (for small lakes < 50 ha) or 20 (for lakes > 50 ha) transects to be performed using a boat. The abundance of hydrophytes in each transect is an estimated value obtained by either exploring with bathyscopes or extracting a certain number of samples with

grabs or rakes at the intervals (plots) within each transect. Then the total macrophyte cover in the whole lake is inferred by gathering the transect/plot data abundances obtained discontinuously in space. Therefore, the whole macrophyte cover at the lake is often difficult to quantify accurately by traditional methods and is even more complicated if we consider the spatial heterogeneity and aggregation patterns of macrophyte communities (Hunter et al., 2010). However, high-resolution UAV imagery can provide almost real macrophyte cover measures. UAV imagery can substitute field transect works by being a very efficient, and potentially more accurate, method to measure the macrophyte cover that is not affected by the spatial arrangement of macrophyte patches. Thus, many authors agree about the effectiveness of UAV methods for mapping and quantifying submerged and emergent aquatic vegetation (Hunter et al., 2010, Venturi et al., 2016, Rhee et al., 2017, Chabot et al., 2018, Kageyama et al., 2018, Meneses et al., 2018).

With the proposed methodology, a high-resolution orthoimage (GSD 2.5 cm) can be obtained from flight planning the final product in almost real time. In this study, the flight duration to collect remote sensing information lasted no longer than 30 minutes, which is a very short time compared to field macrophyte surveys, which currently take at least 3 hours to perform transects and to collect macrophyte abundance data for the ecological status assessment of Spanish lakes. Additionally, the short time required by UAV flights avoids some issues related to sun tilt or other changing weather conditions and does not, therefore, affect the quality of the results (Rivas et al., 2016). Moreover, once the field validation has been performed in a lake, the temporal evolution of the macrophyte community cover and ecological processes in the lake are affordable with this time-effective method, which can become a useful tool for risk assessments and environmental management.

UAV methods followed to quantify macrophyte cover are apparently less invasive than traditional macrophyte surveys based on transect/plot methods, which can be an advantage to be considered for preserving lake integrity. Flight operations are performed from the lake shore and the short duration of drone flights barely im-

pacts the aquatic environment, except for reduced fieldwork validation. In contrast, traditional surveys performed to quantify aquatic vegetation (transects/plots) often take several hours and can cause greater lake ecosystem perturbations (use of grabs and rakes, waterfowl disturbances, etc.) than UAV flights. Moreover, the small-sized UAV used in this study did not seem to bother the waterfowl in the studied lake (a small population of ducks and coots).

Finally, successful detection of ecological events and stratification processes by UAV imagery, which were not identified from a ground view, is a relevant result of this study. The deep stratification processes detected by the UAV RGB images were completely ignored by a ground view. For example, deep sulphur bacteria blooms at the bottom of dolines (4 m deep) were not noticed from a boat, and the same occurred with the formation of white colloidal layers at a depth of 2 m. Likewise, the burial of charophytes by cyanobacterial mats was not detected until the RGB images had been processed. These results emphasise the advantages of using UAV imagery for ecological monitoring purposes.

### Limitations of applying UAV

The proposed UAV-based method has some limitations that must be considered in ecological assessments. The following limitations are outlined: 1) consider the restrictions of national regulations on drone use; 2) weather conditions affect geomatic product quality; 3) when assessing the temporal evolution of a water body, intrinsic aspects might change between flights and affect the end result; 4) other different constraints may come into play, such as the presence of obstacles or barrier elements, waves disturbing the water surface, administrative limitations in preserved areas, etc.

National regulations must be checked and met in the flight planning phase. Areas over which it is forbidden to fly drones (urban zones, infrastructure, roads, security zones, airports, military installations, etc.) should not lie near the studied water body. Height flight is also limited and differs between countries. Similarly, flight distance might be limited by regulations. Regarding Natural Protected Areas (including waterfowl breeding

areas, sensitive wetlands for waterfowls, ZEPAs), drones are not generally allowed. It is necessary to request authorisation for scientific proposes from the organisation responsible for managing preserved areas.

The main limitation of the method followed in the present study was wind velocity. Wind tolerance depends on equipment, specifically its size and weight. With the equipment herein used (Microdrones md4-1000, 1.2 kg), flights were performed at a wind velocity lower than 2 m/s. A higher wind velocity can produce blurry images. During the study period, flights were impracticable on 12.3 % of the days due to adverse weather conditions, such as high wind velocity. Cloudiness and lighting also affect the results. Performing flights at noon is recommendable, at around 12:00 h solar time (Ortega-Terol *et al.*, 2017).

Water clarity or turbidity is the main constraint related to the water body condition that affects the maximum depth visible on the UAV images. Generally, with RGB cameras and under normal lighting conditions and clear waters, it is possible to classify the submerged vegetation of lakes up to a depth of 2.5 m (Kageyama *et al.*, 2018, Tóth, 2018), but changes in turbidity can affect the maximum depth resolution. In the studied lake, features at a depth of 4 m were detected under clear water conditions, which makes this methodology very useful for detecting lake stratification processes and for mapping deep macrophyte communities.

Finally, another limitation was water surface stabilisation due to either the formation of waves by wind or displacements of water birds as waves make the visibility of lake bottoms difficult. Occasionally, some images were affected by coots moving over the water surface during flight (see Fig. 4a, the bright white cloud at the top left of the image), although short flight durations can avoid this inconvenience.

### CONCLUSIONS

The following results obtained with this study are emphasised:

1) UAV imagery can be used to map submerged lake vegetation. The macrophyte cover (including hydrophytes and helophytes) can be



addressed by this methodology for ecological status assessments in the WFD context. High-resolution UAV imagery can provide almost real macrophyte cover measures, unlike the estimations inferred by traditional macrophyte surveys based on transects/plots.

2) UAV imagery detected ecological processes of interest for lake management purposes: decay-ing charophyte meadows by epiphytic cyanobac-terial proliferation; deep purple sulphur bacteria blooms; and other stratification processes (metal-imnetic white colloidal layers).

3) The ecological processes detected by UAV imagery (burial of charophytes, stratification fea-tures) were neglected at the ground view from a boat, and they were not detected until the RGB images were processed. These results emphasise the usefulness of high-resolution UAV imagery for ecological monitoring purposes.

4) The proposed methodology for quantifying the whole lake macrophyte cover is less time-con-suming than traditional methods based on field-work by transects/plots.

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