

# **Determinant factors of diatom assemblage's distribution along the Coastal Central Constantine (Northeastern Algeria)**

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**Abstract** The present study is based on the identifcation of benthic diatoms sampled along the Coastal Central Constantine in northeastern of Algeria. Our work aims to address relationships between environmental variables and characterize the spatial and temporal distribution of the diatom fora. Diatoms and samples for physicochemical analysis were collected from 26 sampling sites between May 2017 and August 2018. The number of species accounted for was 109 species in the Safsaf watershed, 117 taxa in the Kebir and 129 species in the watershed of Guebli which was the most diversifed catchment. The great majority of diatom taxa were cosmopolitan species. Naviculaceae were the most abundant (47.87%). Our results demonstrated the main environmental

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variables controlling the diatom distribution in all the watersheds, including conductivity, and pollution gradients highlighted in Canonical Correspondence Analyses (CCA). The results of the Shannon diversity index (H') showed that the species diversity observed in the sampled sites during summer is higher than that observed in spring and winter. During this season, mean Shannon diversity values were around  $H' = 4.49$ , 3.98, and 4.17, respectively, while species richness varied between 13 and 34 across the three watersheds.

**Keywords** Benthic diatoms · Canonical correspondence analysis · Diversity indices · Environmental gradients

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## **Introduction**

Diatoms are unicellular microalgae belonging to the phylum Bacillariophyta. They proliferate in rivers, colonizing nearly all suitable habitats, and have been widely used in studies related to water quality monitoring (Round [1991](#page-23-0)). They are the most common and diverse group of organisms found in many rivers and streams, making them vital components of these ecological systems. River benthic communities are infuenced by a variety of factors, particularly ionic content, pH, dissolved organic matter, and nutrients, with populations responding diferently depending on their particular environmental tolerances (Potapova and Charles [2003,](#page-23-1) [2005;](#page-23-2) Blanco and Bécares [2010\)](#page-22-0).

Benthic diatom communities respond quickly to water disturbances, such as changing physicochemical conditions or pollution-related stressors. Due to their ability to respond to environmental changes, benthic diatoms have been used in aquatic bio-assessment over the years (Round [1991](#page-23-0); Szczepocka and Szulc [2009](#page-23-3); Solak and Àcs [2011;](#page-23-4) Taş et al. [2019](#page-24-0)), and for example they are widely used as indicators of water quality in lotic ecosystems (Pandey et al. [2017](#page-23-5); Tan et al. [2017](#page-24-1); Ozer et al. [2018](#page-23-6)). In various regions, numerous diatom indices have been developed as a tool to assess the ecological status of rivers (Prygiel and Coste [1996](#page-23-7); Prygiel et al. [2002](#page-23-8); Lavoie et al. [2006;](#page-23-9) Tison et al. [2008](#page-24-2)).

Most research on benthic diatoms and their relationships with ecological factors has been conducted in Europe and the United States (Potapova and Charles [2003](#page-23-1); Rimet [2009;](#page-23-10) Blanco et al. [2013;](#page-22-1) Oğuz et al. [2020](#page-23-11)). To our knowledge studies on benthic diatoms in Algeria are limited. To date Baudrimont [\(1974](#page-22-2)) made signifcant contributions to the diatom fora from fresh and brackish waters of Algeria.

Further, to our knowledge, Algerian hydrosystems have been very little studied to date, particularly with regard to their ecological aspects using benthic diatoms. Studies by Chaïb et al. ([2011\)](#page-22-3), Chaïb and Tison-Rosebery [\(2012](#page-22-4)), and Nehar et al. [\(2015](#page-23-12)) who mainly focused on taxonomy and/or water quality assessment of rivers from northern Algeria, constitute a signifcant contribution to the diatom database of Algeria.

Chaïb et al [\(2011](#page-22-3)) described numerous diatom taxa in El Kebir-east watershed in the eastern coastal area of Constantine (northeast Algeria), reaching 322 identifed species sampled over a span of 3 years at 23 sampling stations, where a marked longitudinal gradient was the key determinant of the distribution of these diatom communities. In addition, two more factors that afected the shape of diatom assemblages were related to water conductivity and also the manmade impact. In comparison, Nehar et al. [\(2015](#page-23-12)) reported 56 taxa collected from El-hammam stream at Mascara and estuary of Chelif River at Mostaganem (northwest Algeria), most of them cosmopolitan species but with 10 taxa being recorded for the frst time in the country. In their papers, those authors suggest a revision of autecological values for taxa because of the peculiar water quality context of the Algerian hydrosystems.

Recent works conducted on diatoms of some Algerian wetlands have recorded few numbers of diatom taxa compared to other studies, e.g., El Haouati et al. [\(2015](#page-22-5)) recorded 24 species in Reghaia lake in northern Algeria, and Chabaca et al [\(2020](#page-22-6)) reported 18 genera in Oubeira lake (northeast Algeria). The diatom fora of Chott-Chergui and Ain Dalia dam (northwest and northeast Algeria) was composed of 36 and 72 species, respectively (Heramza et al. [2021](#page-22-7); Negadi et al. [2021](#page-23-13)), while the study of Draredja et al. [\(2019](#page-22-8)), carried out in Mellah lagoon (northeast of Algeria), reported 160 diatom taxa including 52 centric species and 108 pennate species. All of those authors focused their studies on monitoring the spatiotemporal evolution of diatom communities and on defning the main abiotic factors contributing to these dynamics.

The present study is a contribution to complete the Algerian database of diatoms inventoried, set up to date by the aforementioned works and the determinant factors of their distribution. Our investigation is the frst of its kind to be carried out with a large sample size in space and time in the watershed of the Coastal Central Constantine, divided into three main watersheds (Safsaf, Kebir, and Guebli) which belongs to the Mediterranean region, characterized by a humid to sub-humid (subtropical) climate (Titi Benrabah et al. [2013](#page-24-3)).

The present paper aims to: (a) Evaluate the contribution of the environmental variables in the distribution of diatom species, and (b) Set up a checklist of the diatom species identifed in all sampling sites of the Coastal Central of Constantine.

<span id="page-2-0"></span>**Table 1** Geographical location and characteristics of the studied sites

Watershed	<b>Sites</b> number	Sites name	Sites codes	Latitude	Longitude	Altitude	Width Depth	
Saf Saf	1	Safsaf upstream	SSU	36° 42' 9.6588" N	$6^{\circ}$ 51' 45.5076" E	35	10	31
	$\mathfrak{2}$	Safsaf downstream	<b>SSD</b>	36° 50' 45.9420" N	6° 56' 9.5388" E	21	10	32
	3	Zeramna upstream	SZU	36° 50' 24.8496" N	6° 53' 26.7720" E	22	4	24
	4	Zeramna downstream	<b>SZD</b>	36° 52' 7.1400" N	$6^{\circ}$ 55' 21.6408" E	14	9	32
	5	Aghbel upstream	<b>SAU</b>	36° 41' 54.3876" N	6° 47' 49.5888" E	89	3	17
	6	Aghbel downstream	<b>SAD</b>	36° 42′ 10.4580″ N	$6^{\circ}$ 48' 0.0900" E	87	4	15
Kebir	7	El kebir upstream	<b>KKU</b>	36° 45' 41.7060" N	7° 17' 50.5968" E	31	5	32
	8	El kebir downstream	<b>KKD</b>	36° 51' 39.7116" N	7° 17′ 53.0880″ E	14	7	43
	9	Mougger upstream	<b>KMU</b>	36° 42' 4.2696" N	7° 18' 35.4240" E	43	7	34
	10	Mougger downstream	<b>KMD</b>	36° 42' 6.4116" N	7° 18' 34.7220" E	47	6	32
	11	Emchekel upstream	<b>KEU</b>	36° 44′ 38.4576″ N	7° 14' 22.2720" E	39	6	50
	12	Emchekel downstream	<b>KED</b>	36° 44′ 36.8340″ N	7° 14' 25.8936" E	38	6	38
	13	Fendek upstream	<b>KFU</b>	36° 43′ 38.2080" N	7° 05' 1.9644" E	97	8	36
	14	Fendek downstream	<b>KFD</b>	36° 43' 42.6036" N	7° 05' 2.5260" E	104	6	32
	15	Adjoul upstream	<b>KAU</b>	36° 44' 33.7380" N	7° 08' 55.9320" E	72	3	18
	16	Adjoul downstream	<b>KAD</b>	36° 44' 37.7376" N	7° 08' 59.4600" E	73	3	20
Guebli	17	Guebli upstream	GGU	36° 45' 46.0116" N	6° 39' 27.9468" E	85	5	31
	18	Guebli downstream	GGD	36° 49' 34.9176" N	6° 38' 57.6708" E	46	$\overline{4}$	28
	19	Fessa upstream	<b>GFU</b>	36° 40' 8.3388" N	6° 36' 14.2488" E	183	3	22
	20	Fessa downstream	<b>GFD</b>	36° 40' 22.2096" N	6° 36' 17.4528" E	201	3	19
	21	Bir recade upstream	<b>GBU</b>	36° 50' 5.0388" N	6° 39' 39.1248" E	80	3	23
	22	Bir recade downstream	<b>GBD</b>	36° 49′ 57.1584″ N	6° 38' 19.9896" E	54	$\overline{4}$	25
	23	Meraba upstream	<b>GMU</b>	36° 37' 38.5356" N	6° 38' 4.0200" E	264	3	14
	24	Meraba downstream	<b>GMD</b>	$36^{\circ}$ 38' 11.5656" N	6° 38' 28.4568" E	238	3	12
	25	Bin ouidene upstream	GOU	36° 48′ 5.8464″ N	$6^{\circ}$ 33' 54.8640" E	84	3	18
	26	Bin ouidene downstream	GOD	36° 48′ 35.0568″ N	6° 34' 6.3948" E	72	3	18

## **Materials and methods**

#### Study area

As aforementioned our study was conducted throughout the Coastal Central Constantine, divided into three main watersheds (Safsaf, Kebir, and Guebli). In each watershed, samples were taken upstream and downstream of the main watercourse and its tributaries (Table [1\)](#page-2-0).

The Coastal Central Constantine watershed is situated in the northern part of Algeria and encompasses the entire city of Skikda. The cities of Constantine and Guelma border the south, Annaba city borders the east, and Jijel and Mila cities border the west. The watershed belongs to the Mediterranean region, which is defned by a humid to sub-humid climate

(Titi Benrabah et al. [2013\)](#page-24-3), with rainfall varying from 650 to 1800 mm. The riverbed substratum includes pebbles, stones, silt, sand, gravel, and blocks. All three watersheds are characterized by various anthropogenic pressures: the Safsaf watershed receives the discharges of the industrial zone of Skikda city (location of a petrochemical complex), and urban domestic water infows (Khelfaoui and Zouini [2010\)](#page-22-9). The Kebir watershed is subject to signifcant anthropogenic activities, including deforestation, misuse of agricultural fertilizers, population growth, untreated discharges of industrial activities, and urban wastewaters (Bouleknafet and Derradji [2017\)](#page-22-10). In the Guebli watershed, the pressures from agglomerations and urban sewage threaten also its water quality (Mecibah et al. [2019\)](#page-23-14).

<span id="page-3-0"></span>**Fig. 1** Map of the study area indicating the location of the sampling sites from the Coastal Central Constantine. See Table [1](#page-2-0) for sampling sites codes



## Diatom sampling

The sampling sites were selected according to their accessibility, the presence of suitable substrata, and the shade. The samples were collected across the three seasons: winter, spring, summer which encompasses the fall. A total of 26 sampling sites were monitored upstream and downstream of thirteen tributaries between May 2017 and August 2018 (Fig. [1](#page-3-0)).

Diatoms were collected together with water samples for physicochemical analyses. The samples were collected and treated according to the standardized (Frensh) method NF T90-354 (AFNOR [2007\)](#page-22-11) by scraping a total area of  $100 \text{ cm}^2$  of the upper substrate surface (rocks, pebbles, and stones) using a small brush. At least 5 stones or small blocks were scrapped, then the diatom suspensions were poured and preserved in bottles containing 5% formaldehyde. In the laboratory, samples were digested by heating

in a sandbox using a few drops of hydrogen peroxide  $(H<sub>2</sub>O<sub>2</sub> 30%)$  to remove any existing organic matter, in addition to hydrochloric acid to eliminate carbonate matter. For samples with high organic content, few ml of nitric and/or sulfuric acids are added to improve the mineralization of our samples. This step is followed by a series of centrifugations and rinsing until a neutral pH was obtained. Permanent slides were prepared from cleaned diatom frustules, mounted, and conserved using Canada Balsam  $(IR = 1.55)$ . Diatoms were identifed under light microscopy (Optika®  $BX60, \times 1000$ , Ponteranica - BG, Italy). From each permanent slide, a minimum of 400 valves were identifed and counted. Taxa identifcation was accomplished at the species-level in accordance with the works of Hofmann et al. [\(2011](#page-22-12)), Blanco et al. [\(2010](#page-22-13)), and Krammer and Lange-Bertalot [\(1988](#page-22-14)–1991).

#### Physicochemical and environmental parameters

Water samples were collected at mid-depth, against the stream, and well away from the river bank. Three samples were collected for each sampling site to obtain a representative sample of water quality. Water temperature, flow velocity, and water depth were measured in situ, together with dissolved oxygen (DO, HI 9146 oxymeter, HANNA, Rhode Island, USA), and water conductivity (ORION 3-STAR conductimeter Thermo Scientifc, Waltham, Massachusetts, USA). Total nitrogen (Nt) and phosphates (Pt) were subsequently determined in the laboratory using a photometer (UV-1700 pharmaSpec, SHIMADZU, Tokyo, Japan), biochemical oxygen demand  $(BOD<sub>5</sub>)$ Oxi Top Box®BOD-meter type, Xylem Inc., Washington, D.C., USA), whereas chlorides and chemical oxygen demand (COD) were measured using volumetric dosage methods according to the American Society for Testing Materials (ASTM).

#### Data analyses

#### *Statistical analyses*

A Corrplot analysis was carried out in OriginPro2021 (Seifert [2014\)](#page-23-15) to identify highly signifcant Pearson correlations  $(p<0.001)$  between environmental variables including temperature, velocity, altitude, dissolved oxygen (DO), water conductivity, total nitrogen (Nt), phosphates (Pt), biochemical oxygen demand  $(BOD<sub>5</sub>)$ , chlorides (Cl), and chemical oxygen demand (COD).

Agglomerative Hierarchical Clustering was carried out using the R package pvclust (Suzuki and Shimodaira [2006](#page-23-16)) version i386 4.1.1 (R Development Core Team [2020](#page-23-17)) with the Ward method (Ward.D2, Murtagh and Legendre [2014,](#page-23-18) [2011\)](#page-23-19). This method shows groups of sampling sites, each resulting in a cluster including a group of sites based on their indicator species.

This is a method of arranging factors into homogeneous groups which share the same information and are strongly related to each other (Chavent et al. [2012](#page-22-15)). By summing up the clusters at various levels, and looking for similarities and diferences, each object or data point is treated as a single individual cluster at the very beginning (Vijaya et al. [2019\)](#page-24-4). The algorithm uses comparison metrics (for example, distance metrics) to compare the clusters and determine their similarities and diferences, and the two most similar clusters or data points are merged together (Vijaya et al. [2019\)](#page-24-4). P values were calculated using the IndVal Analysis (Monte Carlo permutation tests McCune and Grace [2002\)](#page-23-20) under R using the package Indicspecies (De Cáceres and Legendre [2009\)](#page-22-16) to obtain diatom indicator species for each group of sampling sites resulting from the cluster analysis.

A preliminary CA showed that gradient length is>2 and thus an unimodal response of species is assumed and that is why we chose the unimodal CCA method. Canonical correspondence analysis (CCA) is a multivariate method of determining the relationships between biotic assemblages and abiotic variables. The method is intended for the extraction of ecological gradients from environmental data. The gradients serve as the foundation for describing and visualizing diferential habitat preferences among taxa using an ordination diagram (ter Braak and Verdonschot [1995\)](#page-24-5). CCA was performed on the environmental parameters cited above using PAST v. 4.03 (Hammer et al. [2001\)](#page-22-17). Variables were log-transformed  $(\log (1+x))$  for species abundances to avoid log (0) values. Two environmental variables were considered for CCA analysis as independent factors: 'seasons' and 'pollution' are expressed as multistate variables. 'Seasons' were converted into numeric values in R using combined functions as.character/ as.numeric (spring=1, summer=2, winter=3). The factor 'Pollution' was frst calculated as an average value of the variables Nt, Pt,  $BOD<sub>5</sub>$ , and COD, then classifed as a numeric value ranging from heavily impacted sites (100) to reference sites (10), with higher values meaning higher degree of pollution. Five  $(5)$  classes were defined (heavily impacted = 100, bad quality=80, moderately impacted=50, slightly  $impeated=30$ , no  $impatch=10$ ). Rare species (less than fve individuals per site or in less than 3 sites) were eliminated for multivariate analyses.

## *Diatom indices and BDI*

Diversity indices were computed also for each sampling site (Shannon's diversity index (H''), Evenness (E), species richness), besides the diatom-based water quality index BDI calculated using Omnidia v. 5.3 (Lecointe et al. [1993\)](#page-23-21). Shannon Weaver Diversity

Index (H') is the most commonly and widely used method to compute the biotic diversity of a given assemblage, determined by the following Eq. ([1\)](#page-5-0) (Shannon and Weaver [1949\)](#page-23-22).

$$
Ht = -\Sigma p_i \log_2 p_i \tag{1}
$$

where  $p_i$  (the relative abundance of specie*i*) =  $(n_i/N)$ .

Species evenness (E) is the ratio of observed (H') to maximum diversity  $(H_{\text{max}})$  given its specific richness following Eq. ([2\)](#page-5-1):

$$
E = HI / H_{\text{max}} \tag{2}
$$

where  $H$  max =  $\log_2 S$  (Ramade [2009](#page-23-23)).

The Biological Diatom Index (BDI) (Lenoir and Coste [1996\)](#page-23-24) is a standardized method developed and used in France for monitoring the quality of watercourses. Prygiel and Coste [\(2000](#page-23-25)) provide detailed descriptions of feld sampling, laboratory processes, taxonomic determinations, and calculation methods in their manual (Coste et al. [2009](#page-22-18)). The BDI has values ranging from 0 to 20 with 5 classes: poor, low, moderate, good and very good. The higher the value of the index, the better the ecological status of the water (Szulc and Szulc [2013\)](#page-23-26). For a given site, BDI score is the average of pollution sensitivity values of the diatom species present, multiplied by their relative abundances, and weighted by the ecological amplitude of each taxon following Eq.  $(3)$  $(3)$ :

$$
BDI = \sum A_i S_i V_i / \sum A_i V_i
$$
 (3)

where  $A_i$ ,  $S_i$  and  $V_i$  denote, respectively, the abundance, pollution sensitivity and ecological amplitude of the *i*th taxon in the diatom assemblage.

The identifed taxa with their abundance are listed in Appendix 1.

## **Results**

#### Diatoms identifcation and ecology

The diatom species identifed belong to seven families. Naviculaceae and Nitzschiaceae have shown the highest species abundance (47.87 and 31.86%, respectively). The total number of species taken into account for all multivariate analyses was 109 species in Safsaf watershed, and 117 species in Kebir watershed. Guebli watershed was the most diversifed

catchment with 129 species. The three watersheds share 61 common taxa (see Appendix 1).

<span id="page-5-0"></span>During spring, the taxa *Achnanthidium minutissimum* (3.80%), *Nitzschia umbonata* (3.41%), and *Navicula phyllepta* (2.88%) were the most dominant among all the species, respectively, in Guebli, Kebir and safsaf watersheds. During summer, the most dominant taxa were *Mayamaea permitis* (2.44%) at Kebir watershed, and *Nitzschia palea* (9.91%) in Guebli and Safsaf watersheds, being dominant during winter at the three watersheds.

<span id="page-5-1"></span>*Nitzschia capitellata* and *Achnanthidium minutissimum* were frequent in *Guebli* and Kebir watersheds during the spring, while *Navicula phyllepta* and *Gomphonema parvulum* were frequent in Kebir and Safsaf watersheds. *Navicula* species were also common in the spring including *Navicula phyllepta* in Safsaf and Kebir watersheds and *Navicula veneta* in Guebli. While *Mayamaea permitis* was frequent in Kebir and Guebli watersheds during the summer period.

<span id="page-5-2"></span>The mean values of the environmental variables calculated for the 3 seasons are summarized in Appendix 2. Temperature maximum values have been recorded in summer and ranged between 26.35 and 31.5 C°, conductivity varied from 300 to 2646  $\mu$ S cm<sup>-1</sup>, and maximum value of total nitrogen (Nt) was recorded in summer at Guebli watershed estimated at 943.27 mg. $L^{-1}$  while in phosphates, at Kebir watershed it was recorded as  $37.26 \text{ mg} \text{L}^{-1}$ . Maximum velocity and dissolved oxygen values have been recorded in winter; velocity varied between 0.04 and 4.25  $\text{cm} \cdot \text{s}^{-1}$  whereas dissolved oxygen ranged from 0.88 to 16.97 mg. $L^{-1}$ . Concerning pollution, the sampling sites ranged from slightly to heavily impacted, which are the most downstream sampling points. In general, samples sampled in summer were characterized by high values of temperature, conductivity, and nutrients compared to those sampled in spring, while samples sampled in winter presented high current velocity and dissolved oxygen (see Appendix 2).

## Correlations between environmental variables

A global correlation analysis was performed on 10 environmental parameters. In the Safsaf water-shed (Fig. [2a](#page-6-0)), chlorides are correlated strongly and positively to water conductivity (Pearson coefficient  $(r) = 0.9$ ;  $p < 0.001$ ). BOD<sub>5</sub> and COD are associated negatively to DO  $(r=0.64$  and 0.69, respectively;

<span id="page-6-0"></span>**Fig. 2** Environmental variables corrplot of Safsaf, Kebir and Guebli water sheds. The letters indicate the watersheds: ( **a**) for Safsaf, ( **b**) for Kebir and ( **c**) for Guebli. The color of the squares is proportional to the Pearson coefficient (red for positive correlation, blue for negative correlation, \*p <0.05 shows signifcant correlation, \*\*p <0.01 shows good correlation, \*\*\*p <0.001 for excellent correlation). The numbers inside the squares refect the precise Pearson value













 $0,8$ 

 $0,6$ 

 $0,4$ 

 $0,2$ 

 $\overline{\phantom{a}}$ 

 $-0.2$ 

 $-0.4$ 

 $-0.8$ 

 $0,8$ 

 $0,6$ 

 $0,4$ 

 $0.2$ 

 $\ddot{\phantom{0}}$ 

 $-0.2$ 

 $-0.4$ 

 $-0.6$ 

 $-0.8$ 



<span id="page-7-0"></span>**Fig. 3** Hierarchical clustering dendrogram of diatom species of Safsaf, Kebir, and Guebli watersheds. The letters indicate the watersheds: (**a**) for Safsaf, (**b**) for Kebir and (**c**) for Guebli. Capital letters indicate the seasons: W for winter, Sm for summer, and S for spring. The colored frames represent the groups: blue=group1, green=group2,  $red = group3$ ,  $orange = group4$ , black = group5

*p*<0.01). For Kebir watershed (Fig. [2](#page-6-0)b), phosphates showed a positive correlation with total nitrogen (Nt)  $(r=0.61; p<0.001)$ . DO demonstrated a negative correlation with temperature  $(r=0.79; p<0.001)$ . In the Guebli watershed (Fig. [2](#page-6-0)c), conductivity showed a signifcant positive correlation with chloride concentrations  $(r=0.64; p<0.001)$ . DO is associated negatively to total nitrogen (Nt)  $(r=0.91; p<0.001)$ .

#### Indicator species

The dendrograms in Fig. [3](#page-7-0) show the results of the Agglomerative Hierarchical Cluster Analysis, grouping of sampling sites. Each cluster includes a group of sites based on their indicator species.

Indicator species of each group of sites were obtained by IndVal analysis using Monte Carlo permutation tests, and resulting P values are shown in Table [2](#page-12-0). We have obtained 16 common indicator species that are considered good indicators in European diatom indices included in Omnidia [\(https://hydrobio](https://hydrobio-dce.irstea.fr/wp-content/uploads/2014/05/OMNIDIAFILE.xls)[dce.irstea.fr/wp-content/uploads/2014/05/OMNID](https://hydrobio-dce.irstea.fr/wp-content/uploads/2014/05/OMNIDIAFILE.xls) [IAFILE.xls\)](https://hydrobio-dce.irstea.fr/wp-content/uploads/2014/05/OMNIDIAFILE.xls) with Indexed Parameter Value  $(IPV) = 3$ .

The cluster sites were classifed based on the indicator species present, and the sampling sites in each cluster shared the same environmental conditions. Five clusters were determined for Safsaf and Kebir watersheds (Figs. [3a](#page-7-0), b), while four groups appeared in the Guebli watershed dendrogram (Fig. [3c](#page-7-0)). For Safsaf watershed, the frst cluster grouping sites of the streams Safsaf and Zeramna sampled in spring, is characterized by high Nt concentrations ranging from 73.01 to 747.74  $mg.L^{-1}$ , and COD (99.55 to 163.97  $mg.L^{-1}$ ) including two species of the genus *Nitzschia.* The second cluster is less diversifed with only *Craticula subminuscula*. While the third group is the most diversifed among all the clusters with fve species. The sampling sites regrouped into these two clusters are sampled in winter, and showed maximal values of current velocity  $(4.25 \text{ cm.s}^{-1})$ , dissolved oxygen  $(13.44 \text{ cm.s}^{-1})$ , and chlorides  $(414.90 \text{ mg})$ .  $L^{-1}$ ). The 4th Cluster, comprised all sites sampled in summer characterized by high temperature ranging between 24.1 and 29.99  $\degree$ C, and low current velocity  $(0.52 \text{ cm.s}^{-1})$ . The last cluster includes the two remaining sites SAD-S and SAU-S with high altitude (85 and 89 m, respectively) and grouped three species.

The frst cluster of Kebir watershed included sites almost slightly impacted with low water conductivity (300 to 1140.5  $\mu$ S.cm<sup>-1</sup>) and comprised three taxa. The second group which comprised sites with slightly high conductivity surpassing 1650  $\mu$ S.cm<sup>-1</sup> was the most diversifed with six species. The third cluster comprising the two impacted sites of Fendek stream showed the highest conductivity values with two taxa *Craticula accomoda* and *Nitzschia umbonata* followed by the fourth group which included nutrient-rich sites with high BOD and COD loads and maximal values on chlorides (521.85 mg. $L^{-1}$ ), which incorporated fve taxa. Coming later the last group comprising sites slightly to moderately impacted showing the highest dissolved oxygen values  $(16.97 \text{ mg}, L^{-1})$  while current velocity ranged from 0.16 to 0.29  $\text{cm} \cdot \text{s}^{-1}$  with four diatoms.

In Guebli watershed, the frst cluster included sites with low water conductivity (from 463 to 873.5  $\mu$ S.cm<sup>-1</sup>) and high current velocity (maximum  $0.33 \text{ cm.s}^{-1}$ ) with three taxa. The second group comprised sites with high dissolved oxygen concentrations showing the lowest diversity with only one specie of the family Surerellaceae. The third cluster included sites with strong water conductivity compared to the stations previously cited, with high altitude with three diatom species. The last cluster was composed of the most impacted sites with high concentrations of BOD, COD, chlorides, and nutrients (Nt and phosphates) and showed the highest diversity with five taxa.

## Environmental variables afecting diatom's distribution

CCA analysis triplots highlighted the main drivers among abiotic variables explaining the distribution of the sampling sites for each watershed (Fig. [4](#page-10-0)). Species names are given in Appendix 1.

For the Safsaf watershed, the frst two axes explained 44.51% of the total variance (Fig. [4a](#page-10-0)). Along the frst axis, the sampling sites were arranged according to a seasonal gradient, sites sampled in spring being plotted on the right positive part of the axis, as opposed to samples taken in summer and winter that are plotted on the left side of axis 1 (Fig. [4](#page-10-0)a).

The sampling sites in summer and winter were plotted along the second axis. The sites sampled in winter and associated with high conductivity, current velocity, and dissolved oxygen values, were characterized by the presence of *Nitzschia frustulum* (*p*=0.013), *Amphora copulata* (*p*=0.024), *Nitzschia clausii* ( $p=0.034$ ), *Hantzschia abundans* ( $p=0.047$ ), and *Nitzschia tryblionella* (*p*=0.039) on the positive part of the axis, whereas *Craticula subminuscula* ( $p = 0.031$ ) was plotted on the negative part of the axis. Sites sampled in summer, characterized by the lowest current velocity, hosted *Navicula erifuga*  $(p=0.004)$ , *Navicula cryptocephala*  $(p=0.044)$ , and *Nitzschia umbonata* ( $p=0.048$ ). In the upper quadrant appear diatoms such as *Cymatopleura elliptica*  $(p=0.001)$ , *Navicula tripunctata*  $(p=0.006)$ , and *Navicula cryptotenella* (*p*=0.029). The pollution vector was observable in the second quarter on the right of CCA1. Species associated with this parameter included *Nitzschia fonticola* (*p*=0.033), and *Nitzschia soratensis* (*p*=0.016).

The frst two axes in the CCA carried out on Kebir watershed explained 25.95 and 20.03%, respectively, of the total inertia. The frst axis segregated sites with low water conductivity from polluted sites, characterized by the presence of species such as *Nitzschia frustulum* ( $p=0.007$ ), *Cocconeis euglypta* ( $p=0.016$ ), and *Craticula subminuscula* ( $p=0.006$ ). The sampling sites sampled in the winter and summer seasons were plotted on the upper quadrant while those sampled in spring were clustered on the lower quadrant. Stations with high current velocity and dissolved oxygen values were plotted in the upper quadrant, characterized by the presence of *Diadesmis confervacea*  $(p=0.003)$ , *Sellaphora pupula*  $(p=0.001)$ , *Fallacia arvensis* ( $p = 0.001$ ), and *Sellaphora difficilima* ( $p = 0.013$ ). On the opposite side, sampling sites showing strong water conductivity were plotted and characterized by the presence of *Cocconeis pediculus* (*p*=0.001), *Cymbella excisa* (*p*=0.006), *Encyonopsis microcephala* (0.015), *Bacillaria paxillifera* (*p*=0.031), *Gyrosigma acuminatum* (*p*=0.030), and *Rhoicosphenia abbreviata* ( $p=0.034$ ). The contaminated sites were clustered around the pollution vector: diatoms taxa showing affinity to this type of habitat were *Craticula accomoda* (*p*=0.016) and *Nitzschia umbonata* (*p*=0.001), while *Navicula gregaria* (*p*=0.047), *Planothidium frequentissimum*  $(p=0.002)$ , *Achnanthidium minutissimum* ( $p=0.008$ ), *Tryblionella constricta* (*p*=0.032), and *Navicula rostellata*  $(p=0.008)$  were plotted on the right part of the CCA plot (Fig. [4](#page-10-0)b, Table [2](#page-12-0)).

Finally, in the Guebli watershed (Fig. [4](#page-10-0)c), the frst CCA axis accounted for 20.76% and the second for 19.62% of the total inertia. A seasonal gradient was visible along the frst axis separating sites sampled in spring from those sampled in summer and winter periods. The pollution gradient appeared along the second axis which distinguished the stations with high altitude and chlorides, and was characterized by the presence of *Cymatopleura solea* (*p*=0.001), *Cymatopleura elliptica* (*p*=0.001), *Caloneis amphisbaena*





Axis 1 (25.95%)



<span id="page-10-0"></span>**Fig. 4** Canonical correspondence analysis (CCA) triplots ◂showing ordination of diatom species, sites and environmental variables studied in Safsaf, Kebir and Guebli watersheds. The letters indicate the watersheds: (**a**) for Safsaf, (**b**) for Kebir and (**c**) for Guebli. Environmental variables are represented by arrows in green. Sites names are written in black with capital letters indicating the seasons: W for winter, Sm for summer, and S for spring. Species codes are shown in blue. Some taxa codes are hidden. See Table [1](#page-2-0) for sites codes and Appendix 1 for species codes

 $(p=0.001)$ , *Tryblionella levidensis*  $(p=0.001)$  and *Caloneis amphisbaena* f. *subsalina* ( $p = 0.003$ ), from the stations with high velocity and oxygen values and lower conductivity levels. The most indicative species were *Navicula radiosa* (*p*=0.001), *Geissleria decussis* ( $p=0.002$ ), *Achnanthes exigua* ( $p=0.048$ ), and *Surirella angusta* (*p*=0.001), whereas *Nitzschia capitellata*  $(p=0.001)$ , *Navicula phyllepta*  $(p=0.031)$ , and *Gomphonema tergestinum* (*p*=0.006) were the most representative species recorded in Fessa wadi sampling sites.

## Diatom indices and BDI

Shannon index values showed that the specifc diversity observed in the sampled sites across the three watersheds during summer season is higher than in spring and winter. Mean values of Shannon diversity during summer were around  $H' = 4.49, 3.98,$  and  $4.17$ , respectively, at the three watersheds Safsaf, Kebir, and Guebli, while species richness varied between 13 and 34 across the three watersheds (Table [3\)](#page-13-0).

The average diversity (H') and evenness (E) values for Kebir watershed in winter and spring were similar, recording  $H' = 3.86$  and  $E = 0.88$ , respectively, in winter and 3.64 and 0.85, respectively, in spring, while in summer the values were  $H' = 3.98$  and  $E = 0.91$ , respectively. In Guebli watershed, the mean values of diversity (H') and evenness (E) during spring were  $H' = 4.02$  and  $E = 0.90$ , respectively, which are very close to those recorded in the summer  $(H' = 4.17$  and  $E=0.91$ ). At the three watersheds, mean values of diversity and evenness in summer were greater than those obtained in winter and spring.

BDI scores ranged from 1 to 16.5. At Safsaf watershed the highest BDI score (11.05) was obtained in station 5 sampled in spring, while in Guebli watershed the highest value was at station 20 sampled in spring. In Kebir watershed, four stations situated upstream and downstream of the Mougger watercourse sampled in spring and summer recorded the highest BDI scores (16.5, 14.53, 16.5, and 13.63, respectively). The lowest diversity, evenness, and BDI values that were observed at station 13 sampled in spring in Kebir watershed recorded 2.35, 0.62, and 1, respectively (Table [3](#page-13-0)).

## **Discussion**

#### Diatom communities

Spatial and temporal relationships between environmental variables and diatom communities were investigated throughout the present study, and illustrated by the hierarchical clusters, corrplots, and CCA analyses for each watershed separately. Our species diversity fndings are coherent with those of Baudrimont [\(1974](#page-22-2)), who studied taxa from Algerian fresh and brackish waters in arid and semi-arid regions; which has demonstrated also that these species are comparable to those in European freshwaters with noticeable saline and alkaline composition. Most of our identifed taxa have been already illustrated in the book by Lange-Bertalot et al. [\(2017](#page-23-27)), and are known to be cosmopolitan, indicating high conductivity and nutrient-rich waters. The diatom taxa identifed in our sampling sites are common and typically found in the Kebir East, El Hammam, and Cheliff Rivers (northeastern and northwest of Algeria) as reported in the papers of Chaïb et al. [\(2011](#page-22-3)), Chaïb and Tison-Rosebery ([2012\)](#page-22-4) and Nehar et al. [\(2015](#page-23-12)).

Most of these species were identifed recently also in the study of El Haouati et al. ([2015\)](#page-22-5) who recorded 24 taxa in Reghaia Lake. Chabaca et al. ([2020\)](#page-22-6) recorded over 18 genera in the Oubeira lake, and the study by Hermaza et al. ([2021\)](#page-22-7) identifed 72 species in Ain Dalia dam.

The current study is the frst attempt to determine the species composition of the Coastal Central Constantine, Northeastern Algeria, where no research has been conducted before. It contributes to the completion of the Algerian database of diatoms inventoried thus far by the aforementioned works, as well as the determinants of their distribution. Furthermore, our study demonstrates that the key drivers can difer between geographically close watersheds.

#### Dominant taxa and diversity

Over the three watersheds, our floristic results revealed the dominance of Naviculaceae, which showed the highest abundance (47.87%). Similar results were demonstrated at El Kebir-East River (Chaïb et al. [2011](#page-22-3)), and at the streams of Chott Chergui wetland with a percentage of 25.71% (Negadi et al. [2021\)](#page-23-13).

Among the identifed diatoms, the taxa *Gomphonema parvulum*, *Achnanthidium minutissimum, Navicula gregaria, Nitzschia frustulum*, *Craticula subminuscula, Amphora pediculus* and *Nitzschia palea* are common in studies conducted in running waters in northern Algeria (Chaïb and Tison-Rosebery [2012](#page-22-4); Nehar et al. [2015](#page-23-12); Negadi et al. [2021](#page-23-13)).

## Diatoms and water quality

*Nitzschia umbonata* was most abundant in site 13 (KFU\_S) sampled in spring, with an abundance of 70.41%, which decreased largely diversity and evenness values  $(H' = 1.62, E = 0.54)$  thus reflecting the poor water quality of this station  $(BDI=1)$ . The presence of this species is related to pollution (Duong et al. [2007\)](#page-22-19). Chaïb et al. ([2011\)](#page-22-3) observed the proliferation of this diatom at sites associated to pollution in Kebir East, commonly associated with *Nitzschia palea* and *Navicula veneta*. In Turkey, Çetin et al. [\(2021](#page-22-20)) recorded also a high abundance of this species (15.6%) in a polluted river in the Kızılırmak basin. In terms of water quality, as inferred from diatombased indices, Chaïb and Tison-Rosebery [\(2012](#page-22-4)) have already tested the Biological Diatom Index (BDI) in the Kebir-East River, despite the dominance of the indiferent *Achnanthidium minutissimum* (75%) at Ain Assel station (that becomes a temporary pool during the dry periods) with nutrient  $(PO<sub>4</sub><sup>3-</sup>$  and  $NH_4^+$ ) levels attaining 0.5 and 1 mg.L<sup>-1</sup> respectively, this station recorded the highest BDI score (18/20), which did not refect the actual poor water quality of the site.

Efect of environmental variables on diatoms distribution

The results of the CCA triplots demonstrated three environmental gradients controlling the diatom distribution in all the watersheds including conductivity, temperature, and pollution. Some studies have revealed the links between the environmental variables and the diatom community throughout Co-Inertia Analysis (CIA) and Canonical Correlation Analysis (CCorA), e.g., the diatom communities of the Kebir-East River are controlled by environmental conditions, including a high seasonal gradient between floods and drought, acidic to neutral waters, high conductivities and pollution (Chaïb et al. [2011;](#page-22-3) Chaïb and Tison-Rosebery [2012\)](#page-22-4) while the distribution of diatom assemblages of rivers from Chott Chergui wetland are mainly infuenced by temperature and conductivity (Negadi et al. [2021](#page-23-13)). Kivrak and Uygun [\(2012](#page-22-21)) reported that the distribution and the composition of the diatom fora in the Turkish stream Akarçay are afected by the physic-chemistry of water including conductivity,  $PO_4^{3-}$ , and BOD.

According to Nehar et al. ([2015\)](#page-23-12), the diatom species composition and distribution are linked to anthropogenic pressures and driven by various environmental factors such as chlorides, pH, and temperature. In the same way, Hermaza et al. ([2021\)](#page-22-7) studied the spatial and temporal distribution of diatoms of the Aïn Dalia dam and emphasized the impact of nutrients  $(NO<sub>2</sub><sup>-</sup>$  and  $PO<sub>4</sub><sup>3</sup>$ ), suspended matter, temperature, and dissolved oxygen on the diatom distribution. Furthermore, El Haouati et al. [\(2015](#page-22-5)) highlighted the relationship between the environmental characteristics of Reghaia Lake and the diatoms, reporting the direct impact of nutrients  $(PO<sub>4</sub><sup>3-</sup>$  and  $NH<sub>4</sub><sup>+</sup>$ ), temperature, conductivity, and oxygen on the occurrence of diferent diatom taxa.

The waters of the three watersheds were characterized by high conductivities (>1000  $\mu$ S.cm<sup>-1</sup>), and high chloride contents, as confrmed by correlation analyses which revealed a strong correlation between the concentration of chlorides and water conductivity. In particular, conductivity is one of the main environmental factors infuencing the structure and the distribution of diatom communities (Rimet [2009](#page-23-10)).

#### Indicator species and their ecological preferences

The clustering and Indval analysis revealed the presence of the genus *Navicula* such as *N. erifuga* and *N. cryptocephala* (Table [2](#page-12-0)) showing their preference for high temperatures in Safsaf watershed during summer (group 4) (Fig.  $3a$ ); the mean value of temperature being around 29.14 °C. According to Hermaza et al.

<span id="page-12-0"></span>**Table 2** Diatom indicator species of the three

watersheds

species codes \* Signifcance

species codes are underlined on the CCA

names and explanation

Appendix 1. Species in green are commonly

of European streams

[OMNIDIAFILE.xls\)](https://hydrobio-dce.irstea.fr/wp-content/uploads/2014/05/OMNIDIAFILE.xls)

The italics represent the full name of theindicator species, the bolds represent levels:\**p*<0.05, \*\**p*<0.01, \*\*\**p*<0.001. Indicator triplots. For the complete of the species codes see considered good indictors water quality (see indexed parameter value  $(IPV=3)$ column values in [https://](https://hydrobio-dce.irstea.fr/wp-content/uploads/2014/05/OMNIDIAFILE.xls) [hydrobio-dce.irstea.fr/wp](https://hydrobio-dce.irstea.fr/wp-content/uploads/2014/05/OMNIDIAFILE.xls)[content/uploads/2014/05/](https://hydrobio-dce.irstea.fr/wp-content/uploads/2014/05/OMNIDIAFILE.xls) Watersheds Species name Species code p values Groups Safsaf *Nitzschia fonticola* NFON 0.033\* 1 *Nitzschia soratensis* NSTS 0.016\* 1 *Craticula (Eolimna) subminuscula* ESBM 0.031\* 2 *Nitzschia frustulum* NIFR 0.013\* 3 *Amphora copulata* **ACOP** 0.024\* 3 *Nitzschia clausii* NCLA 0.034\* 3 *Nitzschia tryblionella* NTRY 0.039\* 3 *Hantzschia abundans* HABU 0.047\* 3 *Navicula erifuga* NERI 0.004<sup>\*\*</sup> 4 *Navicula cryptocephala* NCRY 0.044\* 4 *Nitzschia umbonata* NUMB 0.048\* 4 *Cymatopleura elliptica* CELL 0.001\*\*\* 5 *Navicula tripunctata*  $NTPT$  0.006\*\*\* 5 *Navicula cryptotenella* **NCTE** 0.029\* 5 Kebir *Nitzschia frustulum* NIFR 0.007\*\*\* 1 *Cocconeis euglypta* CEUG 0.016\* 1 *Craticula (Eolimna) subminuscula* ESBM 0.006\*\* 1 *Cocconeis pediculus* CPED 0.001\*\*\* 2 *Cymbella excisa* CAEX 0.006\*\* 2 *Encyonopsis microcephala* ENCM 0.015\* 2 *Gyrosigma acuminatum* GYAC 0.030\* 2 *Rhoicosphenia abbreviata* RABB 0.034\* 2 *Bacillaria paradoxa* BPAR 0.031\* 2 *Craticula accomoda* CRAC 0.016\* 3 *Nitzschia umbonata* NUMB 0.001\*\*\* 3 *Planothidium frequentissimum* PLFR 0.002\*\* 4 *Achnanthidium minutissimum* ADMI 0.008\*\* 4 *Tryblionella constricta* TRCO 0.032\* 4 *Navicula gregaria* NGRE 0.047\* 4 *Navicula rostellata* NROS 0.008<sup>\*\*</sup> 4 *Diadesmis confervacea* DCOF 0.003\*\* 5 *Sellaphora pupula* SPUP 0.001\*\*\* 5 *Navicula(Fallacia) arvensis* NARV 0.001\*\*\* 5 *Navicula(Sellaphora) difcillima* NDIF 0.013\* 5 Guebli *Navicula radiosa* NRAD 0.001\*\*\* 1 *Geissleria decussis* GDEC 0.002\*\* 1 *Achnanthes exigua* **AEXG** 0.048\* 1 *Surirella angusta* SANG 0.001\*\*\* 2 *Nitzschia capitellata*  $NCPL$  0.001\*\*\* 3 *Navicula phyllepta* **NPHY**  $0.031**$  3 *Gomphonema tergestinum* GTER 0.006 \*\* 3 *Cymatopleura solea* CSOL 0.001\*\*\* 4 *Cymatopleura elliptica* CELL 0.001\*\*\* 4 *Caloneis amphisbaena* CAMP 0.001\*\*\* 4 *Tryblionella levidensis* TLEV 0.001\*\*\* 4 *Caloneis amphisbaena fo.subsalina* CASS 0.003\*\* 4

<span id="page-13-0"></span>**Table 3** Diversity indices calculated for each season for the 26 sampling sites along the watersheds Safsaf, Kebir, and Guebli



Table 3 (continued)	Watersheds	Sites codes	Richness	<b>BDI 2014</b>	Diversity	Evenness
	Guebli	$GGU-W$	32	$12.6\,$	4.71	0.94
		$_{\rm GGU-S}$	32	11.25	4.71	0.95
		$GGU-Sm$	34	10.05	4.95	0.98
		$GGD-W$	33	11.2	4.86	0.96
		$_{\rm GGD-S}$	31	10.8	4.75	0.96
		$GGD-Sm$	$32\,$	10.75	4.72	$0.95\,$
		GFU-W	26	10.5	4.35	0.93
		GFU-S	19	14.05	3.58	0.85
		GFD-Sm	23	13.05	4.08	$\rm 0.9$
		GFD-W	21	$9.4\,$	3.62	$0.82\,$
		$\operatorname{GFD-S}$	20	15.7	3.77	0.89
		GFD-Sm	$23\,$	13.05	4.08	0.9
		GBU-W	37	11.2	5.04	0.97
		GBU-S	24	14.65	4.22	0.93
		$GBU-Sm$	30	12.1	4.76	0.97
		$\operatorname{GBD-W}$	33	11.9	4.99	0.99
		$GBD-S$	29	10.3	4.54	0.94
		GBD-Sm	31	10.15	4.86	0.98
		$\operatorname{GMU-W}$	25	$7.2\,$	3.53	$0.76\,$
		$\mathbf{GMU}\text{-}\mathbf{S}$	12	3.7	2.78	0.83
		$\mathbf{GMU}\text{-}\mathbf{Sm}$	17	6.75	3.47	$\,0.86\,$
		GMD-W	15	$6.0\,$	2.60	0.67
		GMD-S	21	6.25	3.92	0.9
		GMD-Sm	19	4.95	3.32	0.78
		$GOU-W$	13	5.6	2.55	0.69
		$\rm GOU\text{-}S$	$21\,$	$8.9\,$	3.81	0.87
		GOU-Sm	19	9.05	3.66	0.87
		GOD-W	13	6.4	2.95	0.80
		$\operatorname{GOD-S}$	24	10.45	4.07	$\rm 0.9$
		$GOD-Sm$	$21\,$	$7.5\,$	3.75	0.86

For the explanation of sites codes see Table [1](#page-2-0). *W*Winter, *Sm* Summer, and *S* Spring

[\(2021](#page-22-7)), this genus prefers high temperatures in the summer and slightly polluted environments.

According to Indval analysis (Table [2](#page-12-0)), the presence of the indicator species *Nitzschia fonticola* in group 1 (Fig. [3](#page-7-0)a, Table [2\)](#page-12-0) was related to high Nt concentrations and COD. This diatom was recorded also in polluted rivers in north-eastern France (Rimet [2009\)](#page-23-10).

The species *Navicula gregaria* (Fig. [3](#page-7-0)b, Table [2\)](#page-12-0) showed its preference to nutrient-rich sites in Kebir watershed, which indicates the trophic status of these locations. This species has been already noted in Noga et al. ([2014\)](#page-23-28) as tolerant to eutrophic waters. Blanco and Bécares ([2010\)](#page-22-0) confrmed that pollution and the trophic state of water afect the structure and the distribution of such diatom communities.

The taxa *Navicula cryptotenella* in Safsaf watershed, *Navicula rostellata* and *Achnanthidium minutissimum* from Kebir watershed, as well as *Cymatopleura solea* from the watershed of Guebli are related to high loads on Nt and phosphates, which explained their presence in the sampling sites located close to agricultural lands exposed to soil drainage. These taxa colonized nutrient-rich rivers with high N and P loads, as demonstrated in the works of Chaïb et al. [\(2011](#page-22-3)), Chaïb and Tison-Rosebery ([2012\)](#page-22-4), El Haouati et al. ([2015\)](#page-22-5), and Negadi et al. ([2021\)](#page-23-13)**.**

*Craticula subminuscula* was recorded in stations showing the greatest water conductivity in Kebir watershed, this species is known by its tolerance to high conductivity levels, which confrms the results and conclusions of Chaïb and Tison-Rosebery ([2012\)](#page-22-4) and Nehar et al. ([2015\)](#page-23-12).

## Seasonal variation, diversity, and diatom assemblages

The specifc diversity observed in the sampled sites across the three watersheds during summer is above that observed in spring and winter.

This can be explained by the high level recorded in summer of the main variables controlling the distribution of diatoms including temperature, conductivity, and pollution (availability of nutrients). According to Bussard [\(2015](#page-22-22)), temperature, light, nutrient concentration, movement of water masses, and even salinity would all infuence algae growth and distribution.

Similar fndings have been noted in other studies, at Mellah lagoon (H'=4.56 in Draredja et al. [\(2019](#page-22-8)), and in Aïn Dalia dam  $(H'=3$  in Hermaza et al. [\(2021](#page-22-7)). In contrast to these results, diatom assemblages at Oubeïra Lake (Chabaca et al. [2020\)](#page-22-6) were less diversifed compared to those found in our studied basins, with a diversity score of  $H' = 2.35$ . On the other hand, the wet season was the most diverse at Chott Chergui wetland (Negadi et al. [2021](#page-23-13)), while in Reghaia lake, diatom assemblages were more diversifed during spring and fall (El Haouati et al. [2015](#page-22-5)).

*Achnanthidium minutissimum* (ADMI) was abundant in the Kebir watershed during the spring and summer seasons exceeding 17% in station 10 sampled in spring, whereas in Guebli watershed this specie was the most dominant during the spring period reaching 17.91% in relative abundance. Other studies reported also the dominance of this diatom reaching abundances of up to 75% at Kebir East River (Chaïb and Tison-Rosebery [2012\)](#page-22-4), and 55% at El Hammam stream (Nehar et al. [2015](#page-23-12)) in summer, with a mean diversity and evenness scores of  $H' = 2.5$ ,  $E = 0.8$ and  $H' = 1.9$ ,  $E = 0.6$ , respectively, also subdominant (21.26%) in spring at Mina watershed (Negadi et al. [2018\)](#page-23-29) with an average of 2.5 and 0.8, respectively, in diversity and evenness. In Chabaca et al. [\(2020](#page-22-6)), the mean diversity values were 2.34, and 2.22 respectively at two stations in Oubeïra Lake, northeastern Algeria.

Diatom populations in relation to pollution

Populations exposed to impaired waters harbor species tolerant to organic pollution (Castillejo et al. [2018;](#page-22-23) Karaouzas et al. [2018](#page-22-24)). In our case, high levels of organic and chemical pollution (related to sewage and industrial effluents) explained the presence of the tolerant taxa *Craticula accomoda* and *Nitzschia umbonata* in stations 13 and 14 sampled in winter. Cetin et al.  $(2021)$  $(2021)$  reported that those species were also predominant in winter with rates of 12.5% for *C. accomoda*, and 15.6% for *N. umbonata*.

Other pollution-tolerant species were also identifed from impacted sampling sites (mostly all downstream locations in all the watersheds) such as *Nitzschia palea*, *Nitzschia capitellata*, *Navicula veneta*, *Gomphonema parvulum*, and *Mayamaea permitis*. These species, considered pollution indicators, have been already found at polluted sampling sites in a number of studies such as (Cochero et al. [2017;](#page-22-25) Kheiri et al. [2018;](#page-22-26) Rybak et al. [2019;](#page-23-30) Bezzeghoud and Bouhameur [2021](#page-22-27)) besides the monograph by Lange-Bertalot  $(2017)$  $(2017)$ . The significant dominance of *Craticula subminuscula*, *Gomphonema parvulum*, *Nitzschia palea*, and the species complex formed by *Nitzschia inconspicua* and *Nitzschia frustulum* indicate the polluted status of these waters, as shown in a study conducted on Hassar stream in Morroco by Fawzi et al. ([2011\)](#page-22-28).

#### **Conclusion**

The current study is the frst attempt to characterize the benthic diatom communities of Coastal Central Constantine, including three watersheds (Safsaf, Kebir and Guebli) in Northeastern Algeria. Data analyses allowed us to highlight the relationships between the environmental variables and the diatom community composition and distribution. The examined sampling sites in Safsaf, Kebir, and Guebli watersheds are driven by fuctuations in water quality, characterized by high conductivity and pollution levels. A seasonal gradient was also evident, segregating clearly species dominant in spring from those most common in summer or winter. The main variables controlling the distribution of diatom communities across the three watersheds were temperature, conductivity, and pollution. There was a seasonal variation across the three watersheds; summer was the most diversifed; the specifc diversity observed in the sampled sites during summer is above that observed in spring and winter.

Our results are congruent with all studies carried out on benthic diatoms in Algerian streams and highlight the distribution particularities of our species, compared to the ecological profles elaborated during surveys in France, notably for the development of the BDI.

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 **Author Contributions** Sampling was carried out by Hadjer Kaddeche. Treatment of samples, physical-chemical analyses and species identifcation were conducted by Hadjer Kaddeche,

Faïza Noune and Sabrina Dzizi. Hadjer Kaddeche and Nadjla Chaïb collected data, analyzed the results and wrote the frst draft of the manuscript. Nadjla Chaïb and Zine Eddine Boudjellab are thanked for realization and conceptualization of the graphs. Saúl Blanco-Lanza identifed species, supervised the projet and reviewed the results. The fnal manuscript was read and approved by all authors.

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**Data Availability** Not applicable.

#### **Declarations**

**Confict of interest** On behalf of all authors, the corresponding author states that there is no confict of interest.

**Ethical approval** This study did not involve any animals or human participants.

**Financial and Non‑fnancial interests** The authors have no relevant fnancial or non-fnancial interests to disclose.

**Consent for publication** Not applicable.

**Consent to participate** Not applicable.

## **Appendix 1**

See Table [4.](#page-17-0)

<span id="page-17-0"></span>**Table 4** Full names and percentage of abundance of the identifed species



#### **Table 4** (continued)



Species in bold are the common taxa identifed from the three watersheds. Abundance (%) was calculated as the average frequency of diatoms in all the watersheds. The sum of the total abundance of other species was calculated for each watershed separately

# **Appendix 2**

See Table [5.](#page-19-0)

<span id="page-19-0"></span>







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