



## Open Archive TOULOUSE Archive Ouverte (OATAO)

OATAO is an open access repository that collects the work of Toulouse researchers and makes it freely available over the web where possible.

This is an author-deposited version published in : <http://oatao.univ-toulouse.fr/>  
Eprints ID : 10209

**To link to this article** : doi:10.1016/j.jenvman.2013.04.007  
URL : <http://dx.doi.org/10.1016/j.jenvman.2013.04.007>

**To cite this version** : Vignati, Davide A.L. and Secrieru, Dan and Bogatova, Yuliya I. and Dominik, Janusz and Céréghino, Régis and Berlinsky, Nikolai A. and Oaie, Gheorghe and Szobotka, Stefan and Stanica, Adrian Trace element contamination in the arms of the Danube Delta (Romania/Ukraine): Current state of knowledge and future needs. (2013) Journal of Environmental Management, 125 . pp. 169-178. ISSN 0301-4797

Any correspondence concerning this service should be sent to the repository administrator: [staff-oatao@listes-diff.inp-toulouse.fr](mailto:staff-oatao@listes-diff.inp-toulouse.fr)

# Trace element contamination in the arms of the Danube Delta (Romania/Ukraine): Current state of knowledge and future needs

Davide A.L. Vignati<sup>a,b,\*</sup>, Dan Secrieru<sup>c</sup>, Yuliya I. Bogatova<sup>d</sup>, Janusz Dominik<sup>a,e</sup>, Régis Céréghino<sup>f</sup>, Nikolai A. Berlinsky<sup>d</sup>, Gheorghe Oaie<sup>c</sup>, Stefan Szobotka<sup>c</sup>, Adrian Stanica<sup>c</sup>

<sup>a</sup> Institut F.-A. Forel, Université de Genève, CP 416, 1290 Versoix, Switzerland

<sup>b</sup> LIEC, CNRS UMR 7360, Université de Lorraine, Campus Bridoux – Bât. IBISE – 8, rue du Général Delestraint, 57070 Metz, France

<sup>c</sup> National Institute of Marine Geology and Geoecology – GeoEcoMar, 23-25 Dimitrie Onciul Street, 024053 Bucharest, Romania

<sup>d</sup> Research Center (RC) Noosphera, Primorskaya St. 31/1, Odessa 65026, Ukraine

<sup>e</sup> ISMAR-CNR, Arsenal e Tesa 104, Castello 2737 F, I-30122 Venice, Italy

<sup>f</sup> Ecolab, Laboratoire Ecologie Fonctionnelle et Environnement, UMR 5245 UPS-CNRS-INPT, Université de Toulouse, 118 route de Narbonne, 31062 Toulouse cedex 4, France

## Keywords:

Danube Delta  
Trace elements  
Sediments  
Contamination  
Baseline metals  
Self-Organizing Maps

This paper provides the first critical synopsis of contamination by selected trace elements in the whole Danube Delta (Romania/Ukraine) to: identify general patterns of contamination by trace elements across the Delta, provide recommendations to refine existing monitoring networks and discuss the potential toxicity of trace elements in the whole Delta. Sediment samples were collected between 2004 and 2007 in the three main branches of the Delta (Chilia, Sulina and Sfantu Gheorghe) and in the secondary delta of the Chilia branch. Samples were analyzed for trace elements (Cd, Co, Cr, Cu, Ni, Pb, V, and Zn) and TiO<sub>2</sub>, Fe<sub>2</sub>O<sub>3</sub>, MnO, CaCO<sub>3</sub> and total organic carbon. Cluster analysis (CA) and Principal Component Analysis (PCA) showed that levels of Cd, Cu, Pb, and Zn were influenced by anthropogenic activities. At the opposite, concentrations of Cr and Ni largely originated from the weathering of rocks located in the Romanian part of the Danube catchment and naturally rich in these elements. Data analysis using Self-Organizing Maps confirmed the conclusions of CA/PCA and further detected that the contamination tended to be higher in the Chilia and Sulina arms than in the Sfantu Gheorghe arm. The potential ecological risks due to trace element contamination in the Danube Delta could be identified as moderate and localized, provided that the presence of the natural sources of Cr and Ni was properly considered. The available results suggest that monitoring sediment quality at the mouths of Sulina and Sfantu Gheorghe arms is probably enough to get a picture of the sediment quality along their entire lengths. However, a larger network of monitoring points is necessary in the Chilia and secondary Chilia delta to account for the presence of local point sources and for the more complex hydrodynamic of this part of the Danube Delta.

## 1. Introduction

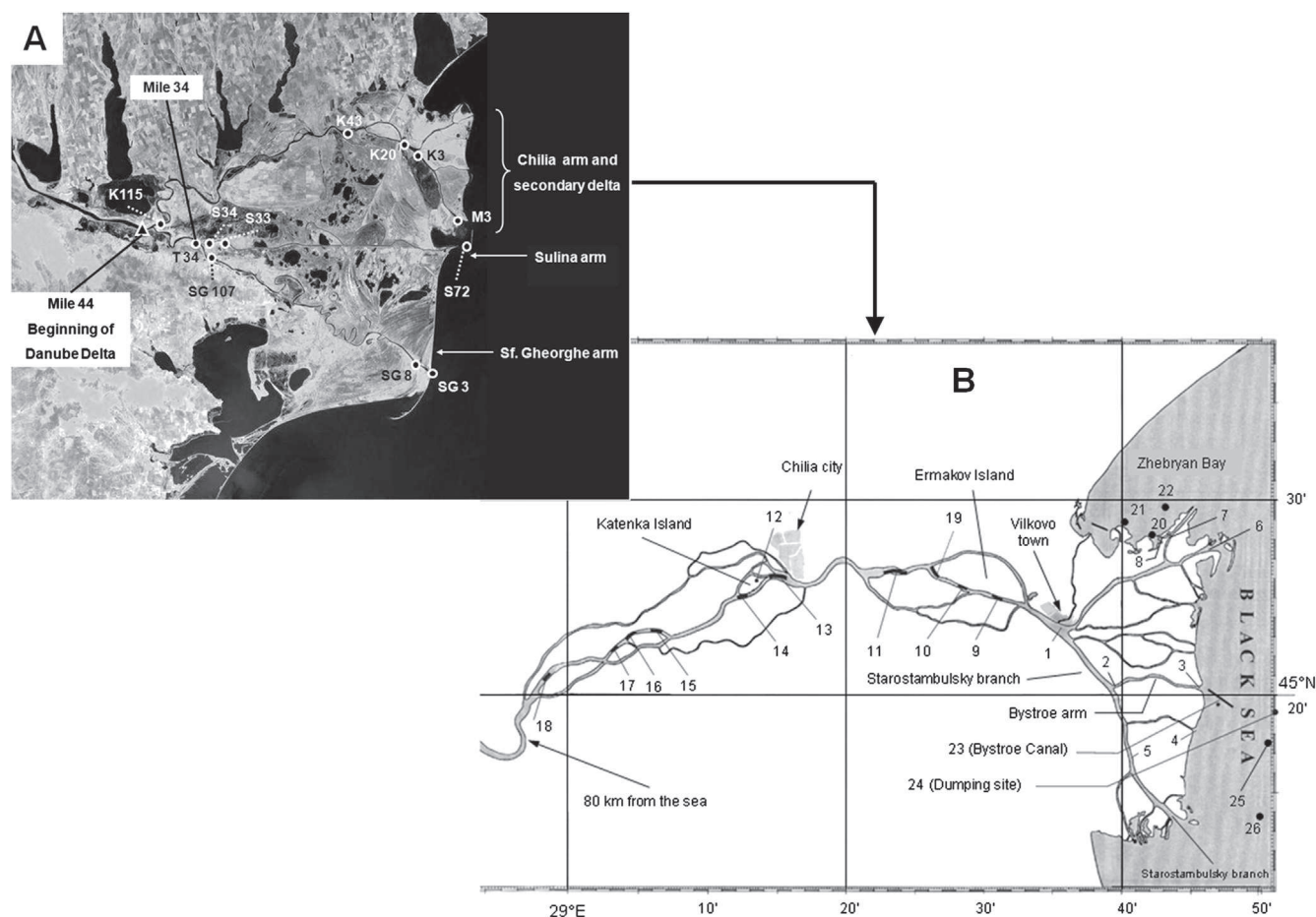
The Danube River flows for 2857 km through ten countries (Germany, Austria, Slovakia, Hungary, Croatia, Serbia, Bulgaria, Romania, Moldavia and Ukraine) across half of Europe. Its watershed area of 817,000 km<sup>2</sup> spreads over 19 European countries and is inhabited by more than 81 million people. It is also the major source of freshwater, nutrients and pollutants to the Black Sea whose coastal

zone is inhabited by at least 20 million people (up to 40 million if the area of Istanbul – Turkey – is included in the computation).

The Danube Delta begins at Ceatal Izmail (*ceatal* being a Turkish word for 'bifurcation'), at Mile 44 from the river mouth, where the Danube divides into two branches: Chilia (going to the North) and Tulcea (going to the South). At Mile 34, the Tulcea branch further divides into Sulina branch to the North and Sfantu Gheorghe branch to the South (Fig. 1a). The two latter branches are entirely on Romanian territory, while Chilia represents the country border between Romania and Ukraine. The Sulina branch has been heavily modified by human activities (Stanica et al., 2007) and is now highly regulated and dedicated to commercial navigation. The Sf. Gheorghe has remained in a more undisturbed state although it was gradually straightened for navigation purposes in the 1980s.

\* Corresponding author. Present address: LIEC, CNRS UMR 7360, Université de Lorraine, Campus Bridoux – Bât. IBISE – 8, rue du Général Delestraint, 57070 Metz, France. Tel.: +33 3 87 37 84 42; fax: +33 3 87 37 85 12.

E-mail address: david-anselmo.vignati@univ-lorraine.fr (D.A.L. Vignati).



**Fig. 1.** Panel A: Satellite view of the Danube Delta area with indication of the 3 main branches (Chilia, Sulina, and Sf. Gheorghe), of the beginning of the Danube Delta and of the sampling sites monitored by Romanian partners on different occasions in 2004–2007. Panel B: Expanded map of the Chilia branch and secondary delta with sampling sites (numbers 1–26) visited by Ukrainian partners in May 2004. The two major settlements of the area (Chilia city and Vilkoovo town) are indicated along with the Bystroe arm, the Starostambulsky branch and some other additional key information. Refer to Table S1 in the supporting information for more details on the sampling sites.

The Chilia branch, at about 18 km from the river mouth, forms the secondary Starostambulsky (or Chilia) delta which, except for the Starostambulsky arm (Fig. 1a), is entirely located in the Ukrainian territory (Tudorancea and Tudorancea, 2006).

Extensive characterization of bed sediments along the whole course of the Danube River was carried out in 2001 and 2007 by the International Commission for the Protection of the Danube River (ICPDR) (Woitke et al., 2003; ICPDR, 2008). However, these surveys included only three sites in the Danube Delta, a UNESCO World Natural Heritage and Ramsar site covering about 5800 km<sup>2</sup> unequally distributed between Romania and Ukraine. Other studies with a more detailed resolution and examining pollution by trace elements in the Danube Delta are, to date, scarce and localized.

Most investigations have been limited to the Romanian or Ukrainian part of the Delta (Burgess et al., 2009, 2011; Oaie et al., 1997, 2005), to some important aquatic depressions of the Delta (Friedrich et al., 2003; Rădan et al., 2000; Rădan and Rădan, 2004), to the marine area located in front of it (Secieru et al., 2006), or to critical stretches of the Danube (Bird et al., 2010; Miličić et al., 2010). A special issue of the journal *Estuarine Coastal and Shelf Science* (volume 54, 2002) provided a wealth of information on various themes, but no overall characterization of the sediments from the whole Delta. Studies simultaneously covering the whole Danube Delta are necessary to highlight general contamination patterns by trace elements in this morphologically and hydrodynamically complex region.

This work, stemming from an international networking effort sponsored by the Swiss National Science Foundation, presents a synthesis of several unpublished monitoring data produced by Romanian and Ukrainian research bodies and has four major objectives:

- identify general distribution patterns for trace elements (Cd, Co, Cr, Cu, Ni, Pb, V, Zn) and sediment characteristics (TiO<sub>2</sub>, Fe<sub>2</sub>O<sub>3</sub>, MnO, CaCO<sub>3</sub>, total organic carbon) across the entire Danube Delta,
- provide recommendations, based on the identified patterns, for refining existing monitoring networks,
- discuss the potential toxicity of trace elements across the whole Danube Delta,
- highlight some geochemical peculiarities (i.e., elevated background levels of Cr and Ni) of Danube Delta sediments and their implication for toxicity evaluation.

## 2. Material and methods

### 2.1. Sampling

Samples were collected during various projects using methodologies routinely adopted by the various parties (Table 1). The aims of the campaigns were varied (e.g., regular monitoring projects, specific investigations, follow-up of major engineering works), but

**Table 1**

Synopsis of the sampling and analytical activities performed in the Danube Delta by participant institutions. Refer to Section 2.1 for sampling procedures and to Section 2.2 for methodological details. LOI, loss on ignition; OC, total organic carbon; RCN, Research Center Noosphera (Odessa, Ukraine).

Sampling period	N. of samples	Sampling area	Methods	Analytes	Involved institutions
May 2004	26	Ukraine: Chilia branch, Chilia secondary delta, Coastal zone	ICP-MS XRF LOI	Cd, Co, Cr, Cu, Ni, Pb, V, Zn CaO, Fe <sub>2</sub> O <sub>3</sub> , MnO, TiO <sub>2</sub> LOI	RCN (sampling), IFAF and University of Lausanne (analysis)
2004–2007	65	Romania: Chilia branch Sulina branch Sf. Gheorghe	GFAAS FAAS XRF Titration	Cd, Co, Cu, Ni, Pb, Zn Fe <sub>2</sub> O <sub>3</sub> , MnO, TiO <sub>2</sub> , V, Cr OC, CaCO <sub>3</sub>	GeoEcoMar
1995–1997	24	As above	As above	As above	GeoEcoMar

a number of core analytes was common to all studies (Table 1) and provided the basis for the first overall evaluation of element contamination and associated sediment characteristics in the entire Danube Delta.

Samples in the Ukrainian part of the Delta were collected in May 2004 by the Research Center Noosphera (RCN, Odessa, Ukraine) during the dredging works leading to the (re)opening of the Bystroe Canal later that year (Schiermeier, 2004). Sampling operations were carried out in cooperation with Delta Pilot State Enterprise at the sites requiring dredging for navigational purposes and at the marine dumping and control sites. At riverine locations (Fig. 1b), sediment cores (upper 20 cm) were taken at about 300 m from the banks in large channels or in the middle of the smaller channels. At coastal/marine locations, samples were collected using a grab sampler with an area of 0.1 m<sup>2</sup>.

In the Romanian part of the Delta, surface sediments samples were collected by GeoEcoMar during various monitoring cruises in 2004–2007 (Table 1) on board of R/V Istros using a Van Veen grab and a Kullenberg gravity corer. Each transect (Fig. 1a) consisted in 1–3 sampling stations, with two samples close to the river banks and one in the middle of the riverbed when possible. Subsamples for the different analyses were collected from the primary grab samples and stored under suitable conditions. Samples from earlier campaigns (1995–1997) were collected with the same techniques and, being previously unpublished, will be presented to evaluate the temporal evolution of sediment contamination (see Section 3.5).

## 2.2. Chemical analysis

Wet aliquots of the samples collected in May 2004 in the Ukrainian part of the Delta were shipped by international express carrier to the Institute F.-A. Forel (IFAF). The analytes of interest were assayed following procedures described elsewhere (Vignati et al., 2003 and Table 1). Sediment water content was determined on independent sediment aliquots and all data are expressed on a dry weight basis. For comparison purposes with data produced by GeoEcoMar (see below), loss of ignition (LOI) was transformed into total organic carbon (OC) dividing by the conversion factor of 14.9 established by Sutherland (1998), while CaO analysis by XRF where converted to CaCO<sub>3</sub> by multiplying by 1.79.

Sediments samples collected in Romania by GeoEcoMar were air dried and grounded until all the material passed through a 0.032 mm mesh sieve. Total Organic carbon (OC) and CaCO<sub>3</sub> were analyzed by titration according to Gaudette et al. (1974) and Black (1965), respectively. Aliquots of sediments were mineralized in open beakers by boiling with concentrated nitric acid ( $\approx 140^\circ\text{C}$  for 8 h; Jickells and Knap, 1984). The residue was evaporated to dryness, re-dissolved in diluted hydrochloric acid, quantitatively transferred to 50 ml volumetric flask and brought to 50 ml with ultrapure water. Trace elements were assayed by flame atomic

absorption – FAAS (Co, Cu, Ni, Pb, and Zn) or electrothermal atomic absorption – ETAAS (Cd) on a Pye Unicam SOLAAR 939E double beam absorption spectrophotometer with deuterium lamp background correction.

The analysis of Fe<sub>2</sub>O<sub>3</sub>, TiO<sub>2</sub>, MnO, Cr, and V were performed by X-ray fluorescence spectroscopy on a VRA – 30 XRF sequential spectrometer, fitted with an X-ray tube with W anode, directly on compacted powders. An analyzer crystal LiF 200 was used to select the characteristic wavelengths, measurements being done with a Na(Tl) scintillation detector. Calibration was carried out with international standards kindly provided by US Geological Survey, the National Institute of Standards and Technology – USA and the National Research Council – Canada, using the relationship between concentration and the difference between the number of impulses recorded at the analytical line and the number of impulses at the background line.

## 2.3. Data presentation and statistical analysis

Raw results for all available samples are reported in Table S1 of the supporting information along with details on sampling locations. All data were centered and reduced before the analysis (Davis, 1986) and three different approaches were used to identify general patterns of sediment contamination across the Danube Delta: Cluster Analysis (CA), Principal Component Analysis (PCA), and Self Organizing Maps (SOM). CA and PCA were performed using Statistica<sup>®</sup> version 7. For R-mode and Q-mode cluster analysis, Euclidean distances and agglomerative hierarchical analysis according to Ward's method were employed for clustering variables or sites. Self Organizing Maps were built using the SOM Toolbox version 2 for Matlab<sup>®</sup> (Vesanto et al., 1999). Temporal differences between 2004–2007 and 1995–1997 data sets were evaluated using the Wilcoxon–Mann–Whitney test.

## 3. Results and discussion

### 3.1. Quality assurance

At IFAF, reproducibility between duplicate sample digestions was generally better than 15%. Element recovery from certified material STSD-2 and STSD-3 (Lynch, 1990) were between 80 and 120% for 3 replicates of each material. The sum of major elements obtained from X-ray analysis was generally higher than 98.5% for samples and 99–100% for standard materials W2 (Diabase, from USGS), DR-N (Diorite) and Br (Basalt) both from the Center de Recherche Pétrographiques et Géochimiques, Vandoeuvre les Nancy, France.

At GeoEcoMar, quality control was performed using reference material BCSS-1 (Marine sediment) from the National Research Council of Canada for both XRF and AAS. Measurements' reproducibility, expressed as the coefficient of variation for six

independent determinations, was better than 10%. Percentage elements' recoveries varied from 85 to 90% for V and Cr to 100.5–108% for the remaining elements.

Besides the proficiency of individual laboratories, it is important to appreciate the possible effects of the different preparation and digestion procedures on the measured metal content and hence on the overall discussion of the results. Considering the typical results of sequential extraction procedures (Bacon and Davidson, 2008), over 80% of Cd, Cu, Pb, and Zn can be mobilized following digestions with diluted acetic acid, hydroxylamine chloride (pH = 1.5) and a mixture of H<sub>2</sub>O<sub>2</sub> and ammonium acetate at pH around 2–3. These extraction steps are milder than the strong procedures used at GeoEcoMar and are comparable with that used at IFAF. In practice, differences due to extraction procedures for Cd, Cu, Pb, and Zn should not exceed 20%. In the case of Cr and Ni, sequential extraction techniques do point to a larger 'residual fraction' of these elements. However, comparison of all available data for Cr and Ni (see Table S1, supporting information) does not reveal systematic differences between analyses performed at IFAF and GeoEcoMar. We further acknowledge that differences in grain size and OC content of the available samples can modify the efficacy of metal extraction from sediments. Harmonization of pretreatment and digestion procedures will clearly be beneficial for improved monitoring of sediment contamination by trace elements in the Danube Delta. However, based on the above considerations, comparison of the results obtained from different institutions involved in this study (Table 1) remains meaningful despite the methodological differences.

### 3.2. General patterns: cluster analysis and principal component analysis

These multivariate techniques were applied on data from 91 samples collected in 2004–2007. R-mode cluster analysis (CA) showed a net separation between Cd, Cu, Pb and Zn and the other parameters (Fig. 2). Cluster A identifies elements that are most influenced by anthropogenic activities and exhibit occasionally high levels at various sites across the Delta (see Table S1, supporting information for details). Cluster B groups V and Cr with TiO<sub>2</sub>, suggesting an eminently natural origin of these elements in association with peculiar rock types in the Danube basin (see Section 3.4 for further discussion). Cluster C includes Ni and several potential carrier phases (CaCO<sub>3</sub>, OC, Fe<sub>2</sub>O<sub>3</sub> and MnO) whose occurrence in

the Delta is probably controlled by various factors such as the relative contribution of detrital material originating from different parts of the basin. The association of Ni with Fe also points to a principally natural origin of this element in Danube sediments (see Section 3.4).

In Q-mode CA (Fig. 2), only cluster C containing samples 16, 18, 27, and 39 (see Table S1) could be clearly identified. All these samples came from Chilia arm and were from locations 16 and 18 in Fig. 1b and K115 (site 27) and K3 (site 39) in Fig. 1a. These samples showed a degree of contamination much higher than all the others available in this study. All other observations were assigned to clusters A and B without any clear separation among samples from the 3 main branches or from the secondary Chilia delta, suggesting a complex within-delta dynamics of sediment transport via the network of delta lakes and secondary branches (Coops et al., 2008).

In principal component analysis (PCA), Cd, Cu, Pb, and Zn showed strong loadings on factor number one and slightly positive loadings of factor number 2; while TiO<sub>2</sub>, Cr, and V scored strong on factor number 2 (Fig. 3). Interestingly, organic carbon, Fe<sub>2</sub>O<sub>3</sub>, MnO, and Ni scored high on factor number 1, but slightly negative on factor 2 (Fig. 3). This pattern points to a certain association between the two groups of variables that could not be captured by cluster analysis. In particular, this indicates that OC, Fe and Mn likely act as carrier phases for Cd, Cu, Pb, and Zn or that the two groups of variables have a common origin. Considering that the two groups are associated on axis 1 (anthropogenic influence), but separated on axis 2 (natural factors) (Fig. 3), the first hypothesis is more likely. Co also showed an association with Ni and Fe<sub>2</sub>O<sub>3</sub> on factor 3 (data not shown), while CaCO<sub>3</sub> remained essentially separate from all other variables on the first 3 principal components. In total, the first 3 components explained about 57% of the total variance. Factors 4 and 5 also had Eigenvalues higher than 1 and satisfied the Kaiser criterion for inclusion in PCA analysis. However, the corresponding Eigenvalue scree plot (Fig. S1, supporting information) showed that the decrease of Eigenvalues leveled off after factor 3 and, considering that no definite interpretation could be given for factors 4 and 5, the main pattern underlying PCA is probably captured by the first three components.

Finally, PCA could not clearly group sites based on their geographical location (Fig. 3) and confirmed the results of CA by identifying the contaminated sites 16, 18, 27, and 39 (see above). Furthermore, sample 64 (site S72), 38 (site K20) and 40 (site K3) were also separated from the big cloud of points at the intersection

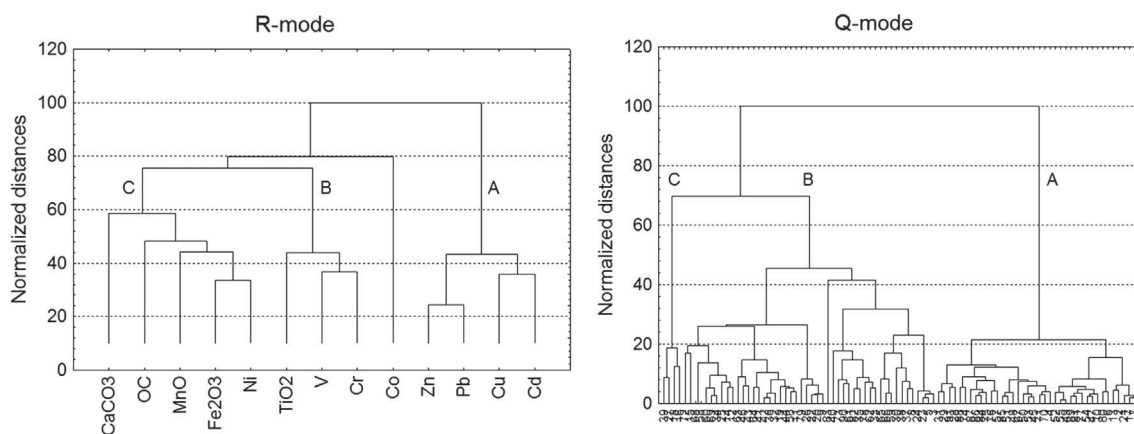
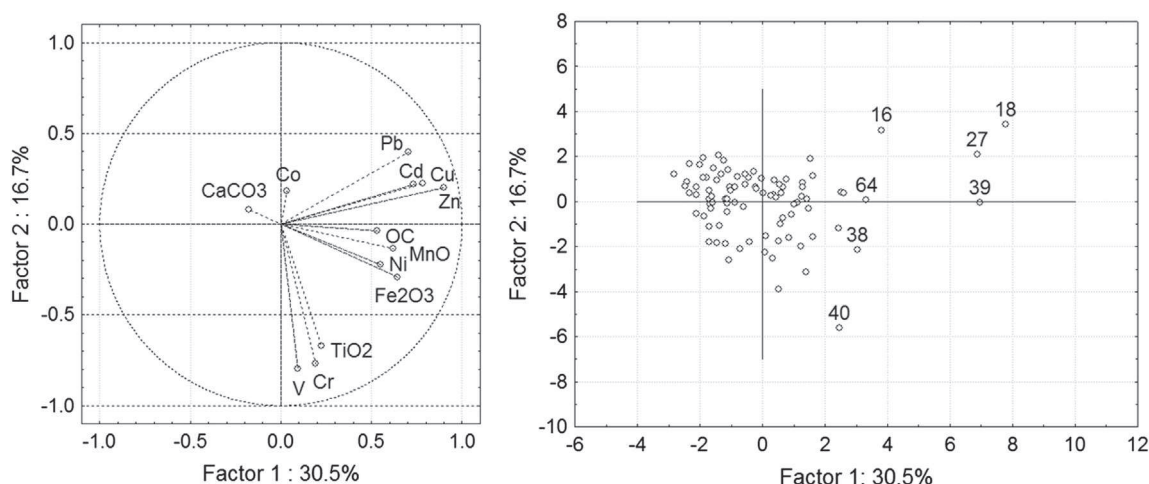


Fig. 2. Results of R-mode and Q-mode cluster analysis performed on 91 samples collected across the Danube Delta in 2004–2007. Agglomerative clustering was performed using Euclidean distances followed by amalgamation according to Ward's method. Refer to text for interpretation of clusters A, B, and C.



**Fig. 3.** Results of Principal Component Analysis performed on 91 samples collected across the Danube Delta in 2004–2007. Only samples clearly distinct from all others are identified by their corresponding number in the right panel (see text and Table S1 for details).

of axes 1 and 2. Sample 64 corresponds to another case of contamination, likely due to the activities of the port of Sulina city. Samples 38 and 40 represent clean sediments at sites K20 and K3, respectively (Fig. 1a). The occurrence of both contaminated and clean material at site K3 is easily explained by the location of Vilkoovo town that directly influences sediment quality on the left bank of the Chilia arm and much less on its right bank (see also Table S1).

### 3.3. General patterns: self organizing maps

The strengths of the SOM in comparison with conventional multivariate analyses were discussed in Giraudel and Lek (2001). Combining ordination and gradient analysis functions, the SOM is convenient to visualize high-dimensional data in a readily interpretable manner without prior transformation. The SOM algorithm is an unsupervised learning procedure that transforms multi-dimensional input data into a two-dimensional map subject to a topological (neighbourhood preserving) constraint (Kohonen, 2001). The SOM thus plots the similarities of the data by grouping similar data items together onto a 2D-space (visualized as a grid) using an iterative learning process that was detailed in Park et al. (2003). The SOM algorithm is specifically relevant for analyzing sets of variables that vary and co-vary in non-linear fashions and/or have skewed distributions. Additionally, the SOM algorithm averages the input dataset using weight vectors through the learning process and thus removes noise. A full description of the modeling procedure employed here (training, map size selection, number of iterations, map quality measurements) was detailed in Park et al. (2003) and C er eghino and Park (2009).

The structure of the SOM for this analysis consisted of two layers of neurons connected by weights (or connection intensities): the input layer was composed of 13 neurons (one per chemical variable) connected to the 91 samples from 2004 to 2007 and the output layer was composed of 50 neurons visualized as hexagonal cells organized on an array with 10 rows and 5 columns. The number of 50 output neurons was retained after testing quantization and topographic errors (C er eghino and Park, 2009). At the end of the training, each sample is set in a hexagon of the SOM map. Samples appearing distant in the modeling space (according to the chemical variables used during the training) represent expected chemical differences for real environmental characteristics.

A k-means algorithm was applied to cluster the trained map (Ultsch, 1993). The SOM units (hexagons) were divided into clusters according to the weight vectors of the neurons and clusters were

justified according to the lowest Davis Bouldin Index (Table 2), i.e., for a solution with low variance within clusters and high variance between clusters (Negnevitsky, 2002). In order to analyze the contribution of chemical variables to cluster structures of the trained SOM, each input variable calculated during the training process was visualized in each neuron (hexagon) of the trained SOM in gray scale. This visualization method directly describes the discriminatory powers of input variables in mapping (Kohonen, 2001).

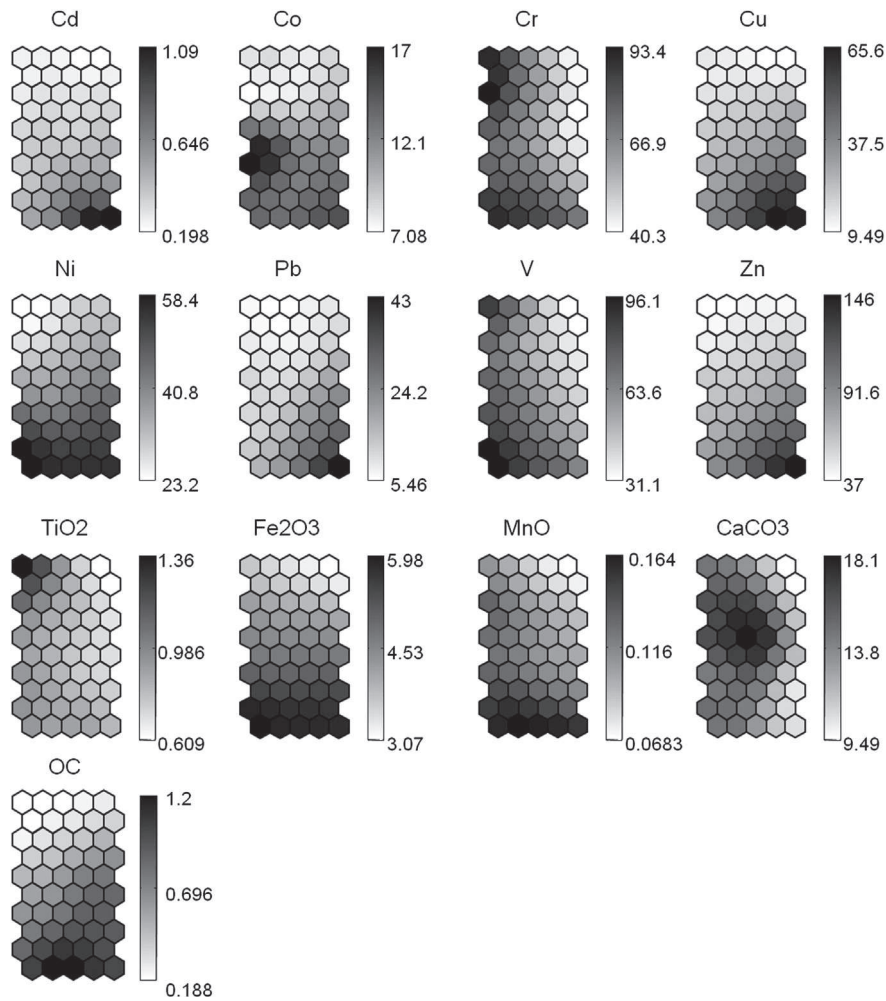
SOM for individual variables (Fig. 4) confirm the results of cluster analysis and PCA by highlighting the similarities in map structures for Cd, Cu, Pb, and Zn; but also highlight additional elements such as the complex relationships between Cr vs.  $\text{TiO}_2 + \text{Fe}_2\text{O}_3$  and Ni vs.  $\text{Fe}_2\text{O}_3$ . Furthermore, SOM allows a better overview of how the different sediments characteristics are reflected across sites with e.g.,  $\text{Fe}_2\text{O}_3$  increasing from top left to bottom of the map and OC increasing from upper left to lower right. Joint examination of SOM for individual variables and the SOM for clustered sites (Fig. 5) provides important additional clues that could not be solved with CA of PCA.

Cluster F, containing the most contaminated sites (Fig. 5), is expanded to include samples number 11 (Fig. 1b), 64 (collected at S72, Fig. 1a), and 79 (collected at SG 107, Fig. 1a). Sites in the secondary Chilia delta are grouped in clusters B and D and, except for 5 samples out of 31, separated from sites in the Sulina and Sfantu Gheorghe branches. This clustering suggests that the secondary Chilia delta responds to factors controlling the general behavior of the main branches, but also to other factors, e.g., marine influence or local sources, that are peculiar to this part of the Danube Delta. Except for sample 73, all samples belonging to Sulina branch are grouped in cluster E and F (Fig. 5) where  $\text{Fe}_2\text{O}_3$ , MnO and OC are higher than elsewhere. Otherwise stated, the Sulina branch, which has been heavily modified to accommodate the transit of large ships, is distinct from Chilia and Sfantu Gheorghe. Finally, with the exception of sample 79, all Sfantu Gheorghe samples are in clusters

**Table 2**

Davies Bouldin Index (DBI) of k-means clustering at different numbers of clusters on the trained Self-Organizing Map (SOM). The retained number of clusters was justified according to the minimum DBI.

	Number of clusters						
	2	3	4	5	6	7	8
DBI	0.9556	1.0797	0.9275	0.7597	0.7440	0.8015	0.8198



**Fig. 4.** Gradient analysis of each variable on the trained self-organising map, with visualization in shading scale (dark = high values, light = low values). Each small map representing one variable can be compared to (or superimposed on) the map representing the distribution of samples shown in Fig. 5.

A, C and (two samples) B. These clusters include the sites with the lowest level of contamination for the anthropogenically impacted elements Cd, Cu, Pb, and Zn (Fig. 5).

Overall, SOM points to the possibility of occasionally encountering moderately contaminated samples in all parts of the Danube Delta; with the majority of them being located in the Chilia and Sulina arm. Sfantu Gheorghe remains a relatively uncontaminated part of the Delta (at least in the period of observation); while sites in the secondary Chilia delta (clusters B and C) are distributed along a contamination gradient reflecting the occurrence of local pollution sources or factors favoring contaminant accumulation such as OC (Fig. 4) or, possibly, sediment grain size (not analyzed in this study). From the management point of view, monitoring of Sulina and Sfantu Gheorghe at the beginning and at the end of their courses is probably sufficient to characterize their overall contamination; although additional areas of sediment accumulation should also be considered. On the other hand, the monitoring network for the Chilia branch and the secondary Chilia delta must be more complex to account for possible local contamination sources.

#### 3.4. Potential toxicity of trace elements in Danube sediments: geogenic origin of Cr and Ni

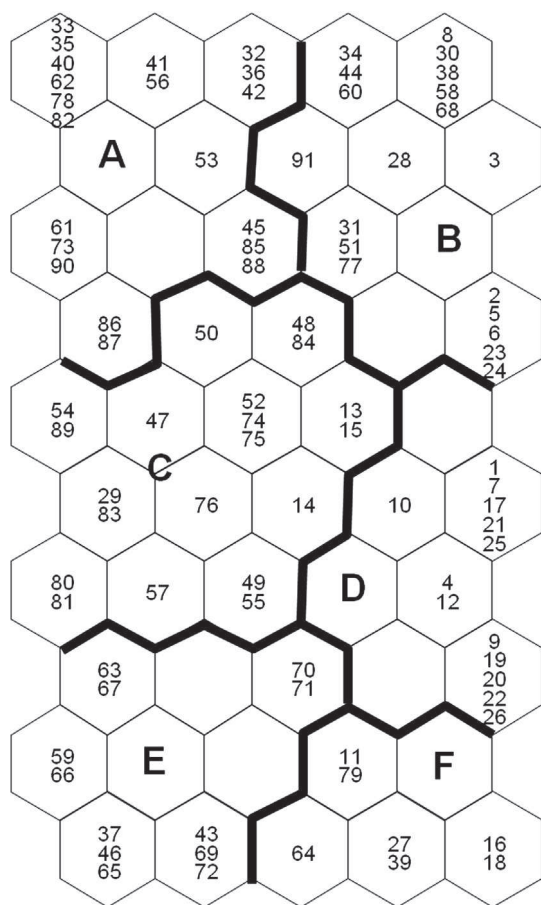
The Probable Effect Concentration Quotient (PEC-Q) approach (Long et al., 2006) allows an overall evaluation of the possible risk

posed by the simultaneous presence of several trace elements. PEC-Q is expressed as:

$$PEC - Q = \frac{\sum_{i=1}^n \frac{[Me]_i}{PEC_i}}{n} \quad (1)$$

where  $[Me]_i$  is the concentration of the  $i$ th element measured in the sample,  $PEC_i$  is the corresponding PEC value (Table S2, supporting information), and  $n$  is the total number of elements which have been measured and for which PEC values are established. While PEC-Qs remain empirically based guidelines, they are superior to comparison among measured concentrations and PEC for individual elements because they account for possible additive contribution to sediment toxicity. Long et al. (2006) report two critical figures for PEC-Qs: 0.25 and 0.34. The former identifies situations where the percentage incidence of toxicity exceeds 20% in laboratory toxicity tests with marine (i.e., *Ampelisca abdita* and *Rhepoxynius abronius*) or freshwater (i.e., *Hyalella azteca*) organisms. The latter points to sites where reduction in the abundances of amphipods, gastropods, and capitellid polychaetes as well as total abundance of benthic organisms are likely to be observed.

Calculations of PEC-Q for samples collected in 2004–2007 (Table 1) according to Formula 1 result in about 75% of the examined samples exceeding the threshold value of 0.25 and approx. 35% above the value of 0.34 (Fig. 6). These percentages would indicate a



**Fig. 5.** Distribution of samples on the Self-Organising Map (SOM) according to measured values for 13 variables and clustering of the trained SOM. Samples that are neighbours within clusters are expected to have similar characteristics in terms of trace element content and  $\text{TiO}_2$ ,  $\text{Fe}_2\text{O}_3$ ,  $\text{MnO}$ ,  $\text{CaCO}_3$  and OC levels. Samples separated by a large distance from each other, according to input variables, are distant in the output space. Clusters A–F were derived from the k-means algorithm. Codes (1–91) correspond to samples as follows: 1–26, Chilia and secondary Chilia delta (Ukraine, May 2004); samples 27–55, Chilia arm (Romania, 2004–2007); samples 56–62, Tulcea arm (Romania, 2004–2007); samples 63–74, Sulina arm (Romania, 2004–2007); samples 75–91, Sf. Gheorghe arm (Romania, 2004–2007). Refer to Table S1 in the supporting information for more details.

very widespread risk of adverse effects of metal contamination in the Danube Delta. However, high PEC-Q values are mostly determined by the high Cr and Ni content of the sediments (Fig. 6). Consequently, the scenarios for the potential ecological risks due to trace element contamination in Danube Delta sediments vary considerably depending on the inclusion or exclusion of these elements in the calculations.

Available knowledge actually supports the hypothesis of an eminently natural origin of Cr and Ni in the Danube sediments. Ultramafic rocks with very high Cr content in association with  $\text{TiO}_2$  are present in the Iron Gates area (800 km upstream from the Delta). In these rocks, Cr is mainly associated with  $\text{TiO}_2$ ; which agrees with the results of our PCA (Fig. 2). Another major natural source of Cr and Ni (in association with Fe) is the Central Dobrogean right bank of the Danube (Oaie et al., 2005). In this area, the river crosses for many kilometers a zone of outcropping green schysts; pre-paleozoic sedimentary rocks (former grainstones) subject in time to a process of anchimetamorphism. Finally, the workshops and factories using Cr and/or Ni along the Romanian and Bulgarian banks of the Danube (e.g., light industry and skin processing) have all been closed for many years. A correct understanding of Cr and Ni

toxicity in Danube Delta sediments must therefore take into account the high background levels of these elements.

To apportion Cr and Ni content between natural and possible anthropogenic sources we followed an approach similar to that described by Secrieru and Secrieru (2002). A robust MM linear relationship was developed between Cr vs.  $\text{TiO}_2$  and between Ni vs.  $\text{Fe}_2\text{O}_3$ . The choice of the carrier phases for Cr and Ni was made following the results of principal component analysis (Fig. 3). A robust MM linear regression is essentially analogous to the widespread Least Square Method, but uses an estimator that is much less influenced by outliers and anomalies in data distribution. The resulting models were:

$$\text{Cr} = (75.6 \pm 1.7)\text{TiO}_2$$

with a proportion of explained variance of 0.83; and

$$\text{Ni} = (8.9 \pm 0.21)\text{Fe}_2\text{O}_3$$

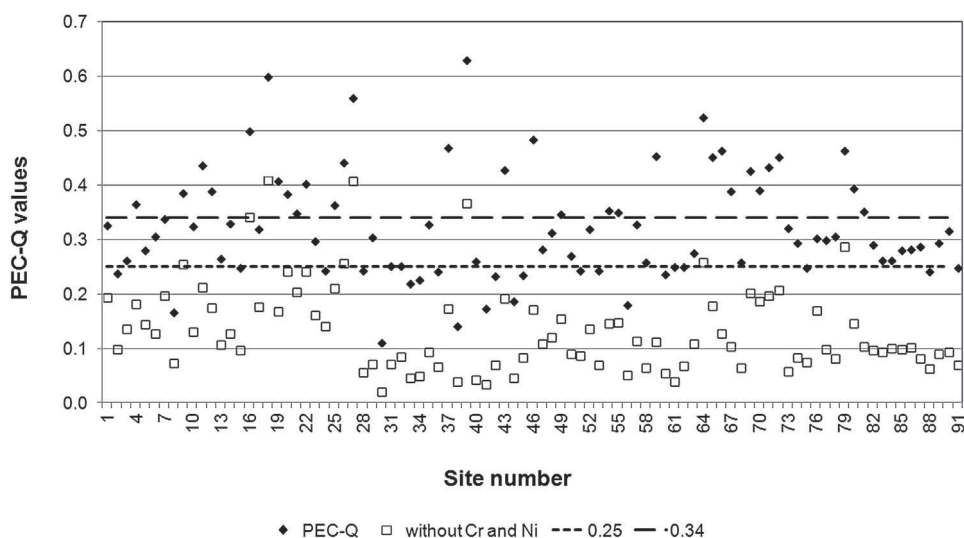
with a proportion of explained variance of 0.78. Chromium and Ni concentrations were in  $\text{mg kg}^{-1}$ , while  $\text{Fe}_2\text{O}_3$  and  $\text{TiO}_2$  levels were expressed as percentage content. Inclusion of  $\text{MnO}$ , LOI or  $\text{CaCO}_3$  in the Ni regression (see PCA) did not increase proportion of variance or improved model predictions presented above.

Modeled values were within  $\pm 25\%$  of measured ones in 62 out of 91 cases for Cr and in 72 out of 91 cases for Ni (Fig. S2, supporting information), with discrepancies larger than 40% being limited to 5 cases for Cr and 11 cases for Ni. From an environmental point of view, positively biased modeled results are of no concern because actual concentrations are lower than predicted ones. This type of discrepancies can be explained by the presence of other phases (such as  $\text{CaCO}_3$  or  $\text{SiO}_2$ ) that have low Cr/Ni content. On the other hand, negatively biased results indicate situations of potential anthropogenic contamination above the background level. In these cases, assuming that modeled results represented natural background values, the excess Cr or Ni remained below 50% of the corresponding PEC values of 111 and  $48.6 \text{ mg kg}^{-1}$ , respectively. These results imply that: Cr and Ni in the Danube Delta sediments have a strong geogenic component, Cr and Ni would contribute only marginally to sediment toxicity, site-specific sediment quality criteria (or appropriate corrections for existing one) are required to properly evaluate Cr and Ni toxicity in the Danube Delta.

We acknowledge that the origin of an element is immaterial for its toxicity, which is controlled by its bioavailability. In the Sava River, the major tributary of the Danube, Cr and Ni have high concentrations, but low extractabilities in acetic acid ( $<0.3\%$  for Cr and  $<16\%$  for Ni) and thus present a low environmental risk (Milacić et al., 2010). The Sava joins the Danube upstream from the Iron Gates and therefore has a minor impact on Danube Delta sediment composition. However, the Sava is impacted by mining activities and can represent a reasonable worst case scenario for Cr and Ni toxicity. Albeit data on metal mobility in the Danube Delta will have to be produced, current knowledge supports evidence for a limited and localized risk from Cr and Ni in the Danube Delta.

Excluding Cr and Ni from PEC-Q calculations yields a much less worrying situation with only 4 samples exceeding the 0.34 criterion and an additional 4 exceeding the 0.25 criterion. These samples correspond to sites 16 and 18 in Fig. 1b (Chilia secondary delta) and to samples 27 (site K115) and 3 (site K3) in the Chilia arm (Fig. 1a). Pollution at site 18 can be explained by the presence of a cardboard and paper factory located a few km upstream and that was in operation in Izmail at the time of sampling (ICPDR, 2005; annex 4). Occasional high contamination at sites K115 and K3 (Fig. 1a) likely reflects the presence of a big underwater dam creating a zone of preferential deposition at K115 and of the city of Vilково at K3. No





**Fig. 6.** Values of Probable Effect Concentration Quotients (PEC-Q) for all the available samples collected in 2004–2007 calculated with and without the inclusion of Cr and Ni. Horizontal lines correspond to PEC-Q criteria of 0.34 and 0.25. Samples 1–26, Chilia and secondary Chilia delta (Ukraine, May 2004); samples 27–55, Chilia arm (Romania, 2004–2007); samples 56–62, Tulcea arm (Romania, 2004–2007); samples 63–74, Sulina arm (Romania, 2004–2007); samples 75–91, Sf. Gheorghe arm (Romania, 2004–2007). Refer to Table S1 in the supporting information for more details.

specific local inputs are known for site 16 (Fig. 1b) and pollution probably comes from diffuse sources or from local features creating conditions for contaminant deposition. The additional four samples exceeding the 0.25 criterion were sample 9 in the Chilia arm and 26 at sea (Fig. 1b), sample 64 in the Sulina branch (site S72, Fig. 1a) and sample 79 in the Sfantu Gheorghe arm (SG 107, Fig. 1a). The presence of Sulina port explains the increased element levels at site S72, while the exact sources at site 9, 26 and SG 107 have not yet been identified.

The PEC-Q analysis suggests that, at present, ecological risks due to trace element contamination in the Danube Delta are moderate and localized, although we lack information on As and Hg; two other elements for which PEC criteria exist, but which were not systematically analyzed in this work. Our conclusions agree well with the results of Burgess et al. (2011) who demonstrated the bioavailability of sediment-bound trace elements at several sites in the secondary Chilia delta and were able to identify trace elements as contributors to toxicity of Danube sediments in laboratory toxicity tests.

### 3.5. Comparison with older unpublished data and literature data

Many socio-economical changes, essentially linked to the collapse of the communist economy, occurred in Romania over the

last two decades. These events led to potentially contrasting consequences on the environment. On the one hand, the economic collapse suddenly halted many industrial activities relying on obsolete practices and technologies. On the other hand, dismissed industrial areas and uncontrolled waste disposal could continue to threaten the environment. Comparison of trace element concentrations in Danube sediments for the periods 1995–1997 (i.e., shortly after the collapse of communist economy) and 2004–2007 (when the country was in the process of joining the European Union) is therefore instructive. The number of measurements for the period 1995–1997 being limited (Table 1 and Table S1), statistical comparison between the two periods was possible only by pooling data for the Chilia, Sulina and Sfantu Gheorghe branches for each period.

Significant differences between 1995–1997 and 2004–2007 were observed for Cd, Cr, Fe, Mn, Ni, Pb, V, and Zn ( $p < 0.02$ , Wilcoxon–Mann–Whitney test). Concentrations in ‘old’ sediments were higher than in recent ones for Cd, Mn, and Pb (Table 3). Cadmium is a known contaminant in fertilizers and the observed reduction likely reflects the abandoning of plans for intensive agriculture in the Danube Delta. The decrease for Pb and Mn can also be linked to the changes in land use, because these elements can enter into the composition of fungicides and other pesticides. In the case of Pb, the phasing out of leaded petrol is a complementary

**Table 3**  
Comparison of trace element concentrations (ranges) in samples collected in this study and previously published results. The row ‘Years’ refers to the periods of sample collection in the various studies. The Joint Danube Survey databases 1 and 2 (<http://www.icpdr.org/wq-db/home>, free access, registration necessary) were accessed on 19th December 2012. All data are in  $\text{mg kg}^{-1}$  dry weight.

Years	Whole delta <sup>a</sup>	Whole delta <sup>a</sup>	Secondary Chilia delta <sup>b</sup>	Delta JDS 1 <sup>c</sup>	Delta JDS 2 <sup>d</sup>	Danube river <sup>e</sup>	Danube tributaries <sup>e</sup>
	2004–2007	1995–1997	2006	2001	2007	2001	2001
Cd	0.115–1.9	0.5–10	n.d.–10	n.d.–1.5	0.6–0.75	<1.1–26	<1.1–33
Cr	20–124	18–101	6–378	71–80	76–102	35–139	26–556
Cu	3.5–94	2–51	1.5–138	40–88	60–105	31–663	31–8088
Ni	11–72	6–78	2.5–41	55–60	144–205	25–143	18–173
Pb	1–73	5–68	0.65–23	27–48	97–343	15–108	18–542
Zn	17–202	6–119	2.5–650	105–170	134–150	83–622	78–2010

<sup>a</sup> This study.

<sup>b</sup> Burgess et al., 2009.

<sup>c</sup> Joint Danube Survey 1; sites JDS98 (Sf. Gheorghe), JDS97 (Sulina), and JDS 96 (Chilia arm, Km 56).

<sup>d</sup> Joint Danube Survey 2; sites JDS93 (Chilia arm at Vilkovo), JDS95 (Sulina), and JDS 96 (Sf. Gheorghe).

<sup>e</sup> Woitke et al., 2003.

explanation for the observed trend. Cr, Fe, Ni, V, and Zn have higher concentrations in recent sediments than in old ones, with Cr, Ni, V, and Zn exhibiting significant correlation with Fe ( $p < 0.01$ , Spearman correlation test). Their increase could then reflect diffuse pollution from ferrous deposits/material left abandoned after the transitions in Romanian economy. However, the observed trend could simply reflect a change in the dynamics of sediment transport and choosing between these or other hypotheses will require additional and regular monitoring.

Concentration ranges for 2004–2007 sediments in this study (Table 3 and Table S1) are comparable with the results of the first and second Joint Danube Surveys (JDS1 and 2) carried out in 2001 and 2007. Our results also compare well with those reported by Burgess et al. (2009) for samples collected in the Chilia secondary delta in September–October 2006 (Table 3). Comparison with results of the JDS1 for the entire Danube course from Neu-Ulm (Germany) to the Delta and for Danube tributaries (Table 3) show that Delta sediments (at least those in the main channels) are, with some exceptions (see Section 3.4), less contaminated than those from some Danube stretches and tributaries.

#### 4. Conclusions

The spatial coverage provided by this study showed that levels of trace elements in sediments of the whole Danube Delta are principally controlled by inputs from upstream, although inputs from local sources can increase contamination at some sites. Trace elements concentrations were comparable among sediments from the three main branches of the Danube Delta, the secondary Chilia delta and the facing coastal zone, further confirming that element inputs to the Delta are essentially from upstream sources. Cluster analysis and PCA identified Cd, Cu, Pb and Zn as elements susceptible to anthropogenic influence, while Cr and Ni concentrations were mainly determined by the presence of rocks naturally rich in these elements in the Romanian territory. These multivariate statistical techniques could not, however, identify geographically coherent groups of sites.

On the other hand, Self Organizing Maps (SOM) gave the following information on the spatial patterns of sediment contamination and characteristics: sites from the secondary Chilia delta were separated from those in the three main Delta branches, sites from the Sulina branch had higher levels of  $\text{Fe}_2\text{O}_3$ , MnO and OC than the other branches, and sites from the Sfântu Gheorghe branch had the lowest levels of sediment contamination. From a management point of view, the combination of results from PEC-Q and SOM indicates that: the secondary Chilia delta must be monitored separately from the main branches, punctual sources of contamination exist along the main Chilia branch and monitoring points upstream and downstream the cities of Izmail, Chilia, and Vilkovo should be included in monitoring programs, Sulina branch is moderately impacted by shipping activities, the Sf. Gheorghe branch is the least impacted part of the Danube Delta. Overall, although only a limited number of parameters were considered, this study provides information to build a joint Romanian–Ukrainian network of monitoring (to complete other international efforts such as Joint Danube Surveys) and points to the necessity to develop specific sediment quality criteria for Cr and Ni in the Danube Delta.

#### Acknowledgements

We thank Prof. Hans-Rudolf Pfeifer and Dr. Jean-Claude Lavanchy (University of Lausanne) and Mr. Fabio Marco Capponi (University of Geneva) for the help with XRF analyses. GeoEcoMar authors acknowledge the financial support of the National Agency for Scientific Research (Romanian National Research Core Programs

GEOMAND, FLUDITMAR and GEOSIDMAR). The financial contribution of the Swiss National Science Foundation (Grants 71P 062626, project NEAR 2 and IB7420-110916, project NEAR 3) for the creation of the *Network for Environmental Assessment and Remediation* (NEAR) was instrumental in bringing together the expertise of the authors.

#### Appendix A. Supplementary data

Supplementary data related to this article can be found at <http://dx.doi.org/10.1016/j.jenvman.2013.04.007>.

#### References

- Bacon, J.R., Davidson, C.M., 2008. Is there a future for sequential chemical extraction? *The Analyst* 133, 25–46.
- Bird, G., Brewer, P.A., Macklin, M.G., 2010. Management of the Danube drainage basin: implications of contaminant-metal dispersal for the implementation of the Eu Water Framework Directive. *International Journal of River Basin Management* 8 (1), 63–78.
- Black, C.A., 1965. *Methods of Soil Analysis*. American Society of Agronomy, Monograph 9, Madison, Wisconsin.
- Burgess, R.M., Konovets, I.M., Kipnis, L.S., Lyashenko, A.V., Grintsov, V.A., Petrov, A.N., Terletskaia, A.V., Milyukin, M.V., Povolotskii, M.I., Demchenko, V.Y., Bogoslovskaya, T.A., Topkin, Y.V., Vorobyova, T.V., Portis, L.M., Ho, K.T., 2011. Distribution, magnitude and characterization of the toxicity of Ukrainian estuarine sediments. *Marine Pollution Bulletin* 62, 2442–2462.
- Burgess, R.M., Terletskaia, A.V., Milyukin, M.V., Povolotski, M., Demchenko, V.Y., Bogoslovskaya, T.A., Topkin, Y.V., Vorobyova, T.V., Petrov, A.N., Lyashenko, A., Ho, K.T., 2009. Concentration and distribution of hydrophobic organic contaminants and metals in the estuaries of Ukraine. *Marine Pollution Bulletin* 58, 1103–1115.
- Céréghino, R., Park, Y.-S., 2009. Review of the Self-Organizing Map (SOM) approach in water resources: commentary. *Environmental Modelling and Software* 24 (8), 945–947.
- Coops, H., Buijse, L.L., Buijse, A.D.T., Constantinescu, A., Covaliov, S., Hanganu, J., Ibelings, B.W., Menting, G., Navodaru, I., Oosterberg, W., Staras, M., Török, L., 2008. Trophic gradients in a large-river delta: ecological structure determined by connectivity gradients in the Danube Delta (Romania). *River Research and Applications* 24, 698–709.
- Davis, J.C., 1986. *Statistics and Data Analysis in Geology*, second ed. John Wiley & Sons, New York.
- Friedrich, J., Dinkel, C., Grieder, E., Rădan, S., Secieru, D., Steingruber, S., Wehrli, B., 2003. Nutrient uptake and benthic regeneration in Danube Delta Lakes. *Biogeochemistry* 64 (3), 373–398.
- Gaudette, H.E., Flight, W.R., Toner, L., Folger, D.W., 1974. An inexpensive titration method for the determination of organic carbon in recent sediments. *Journal of Sedimentary Petrology* 44, 249–253.
- Giraudel, J.L., Lek, S., 2001. A comparison of self-organizing map algorithm and some conventional statistical methods for ecological community ordination. *Ecological Modelling* 146 (1–3), 329–339.
- ICPDR, 2005. *Danube Basin Analysis* (WFD Roof Report 2004), p. 192. ICPDR Document IC/084, 18 March 2005.
- ICPDR, 2008. *Joint Danube Survey 2. Final Scientific Report*. ICPDR, Vienna, p. 242.
- Jickells, T.D., Knap, A.H., 1984. The distribution and geochemistry of some trace metals in the Bermuda coastal environment. *Estuarine, Coastal and Shelf Science* 18, 245–262.
- Kohonen, T., 2001. *Self-Organizing Maps*, third ed. Springer, Berlin.
- Long, E.R., Ingersoll, C.G., MacDonald, D.D., 2006. Calculation and uses of mean sediment quality guideline quotients: a critical review. *Environmental Science and Technology* 40 (6), 1726–1736.
- Lynch, J., 1990. Provisional elemental composition values for eight new geochemical lake sediment and stream sediment reference materials LKSD-1, LKSD-2, LKSD-3, LKSD-4, STSD-1, STSD-2, STSD-3, STSD-4. *Geostandards Newsletter* 14(1), 153–167.
- Milačić, R., Ščančar, J., Murko, S., Kocman, D., Horvat, M., 2010. A complex investigation of the extent of pollution in sediments of the Sava River. Part 1: selected elements. *Environmental Monitoring and Assessment* 163 (1–4), 263–275.
- Negnevitsky, M., 2002. *Artificial Intelligence. A Guide to Intelligent Systems*, first ed. Addison-Wesley, UK.
- Oaie, Gh., Secieru, D., Szobotka, S., Fulga, C., Stanica, A., 2005. Danube river: sedimentological, mineralogical and geochemical characteristics of the bottom sediments. *GeoEcoMarina* 11, 77–85.
- Oaie, Gh., Szobotka, S., Stanica, A., 1997. Environmental state of the River Danube in 1995. *GeoEcoMarina* 2, 149–162.
- Park, Y.-S., Céréghino, R., Compin, A., Lek, S., 2003. Applications of artificial neural networks for patterning and predicting aquatic insect species richness in running waters. *Ecological Modelling* 160, 265–280.
- Rădan, S., Ganciu, A., Strehie, Cl., 2000. Overview of the long term ecological research performed by GEOCOMAR in the Danube Delta, Romania. In: Lajtha, K., Vanderbilt, K. (Eds.), *Cooperation in Long Term Ecological Research in*

- Central and Eastern Europe, Proceedings of the ILTER Regional Workshop, 22–25 June, 1999, Budapest, Hungary. Oregon State University, Corvallis, OR, pp. 101–112.
- Rădan, S.C., Rădan, S., 2004. State of the sedimentary environments of the Matita-Merhei Depression (Danube Delta, Romania) as inferred from magnetic susceptibility data. *Proceeding of the Romanian Academy, Series B. Chemistry, Life-Sciences and Geosciences* 3, 171–179.
- Schiermeier, Q., 2004. Ukraine deluged by protests over plans for Danube Delta. *Nature* 431, 727.
- Secrieru, D., Secrieru, A., 2002. Heavy metal enrichment of man-made origin of superficial sediments of the continental shelf of the north-western Black Sea. *Estuarine, Coastal and Shelf Sciences* 54, 513–526.
- Secrieru, D., Gomoiu, M.T., Oaie, Gh., 2006. Marine Environmental Assessment of the NW Black Sea Area. *GEOSCIENCES 2006 Conference*, 288–291, Sofia.
- Stanica, A., Dan, S., Ungureanu, V.G., 2007. Coastal changes at the Sulina mouth of the Danube River as a result of human activities. *Marine Pollution Bulletin* 55 (10–12), 555–563.
- Sutherland, R.A., 1998. Loss-on-ignition estimates of organic matter and relationships to organic carbon in fluvial bed sediments. *Hydrobiologia* 389 (1–3), 153–167.
- Tudorancea, C., Tudorancea, M.M. (Eds.), 2006. *Danube Delta. Genesis and Biodiversity*. Backhuys Publishers, Leiden, p. 443.
- Ultsch, A., 1993. Self-organizing neural networks for visualization and classification. In: Opitz, O., Lausen, B., Klar, R. (Eds.), *Information and Classification*. Springer-Verlag, Berlin, pp. 307–313.
- Vesanto, J., Himberg, J., Alhoniemi, E., Parhankangas, J., 1999. Self-organizing map in matlab: the SOM toolbox. In: *Proceedings of the Matlab DSP Conference 1999*. Comsol Oy, Espoo, Finland, pp. 35–40.
- Vignati, D., Pardos, M., Diserens, J., Ugazio, G., Thomas, R., Dominik, J., 2003. Characterisation of bed sediments and suspension of the river Po (Italy) during normal and high flow conditions. *Water Research* 37 (12), 2847–2864.
- Woitke, P., Wellmitz, J., Helm, D., Kube, P., Lepom, P., Litheraty, P., 2003. Analysis and assessment of heavy metal pollution in suspended solids and sediments of the river Danube. *Chemosphere* 51, 633–642.