

Assessment of Sediment-Associated Contamination Risks Using New Multivariate Statistical Indexes

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Abstract

This paper presents the assimilation of heavy metal concentration data from sequential extraction method (SEM) with metal toxicity factors to develop and propose a sediment quality index called ecological new contamination index (ECI), to predict the potential ecological risk associated with sediment contamination. Chemical speciation sediment data of five heavy metals: cadmium (Cd), chromium (Cr), copper (Cu), nickel (Ni), and lead (Pb) from five coastal aquatic ecosystems of the Equatorial Atlantic Ocean were used in assessment of the degree of heavy metal contamination. Other contamination indicators (degree of contamination, modified degree of contamination) used in characterization and identification of pollution hotspots, indicate considerably contaminated ecological ecosystems. Evaluation based on ECI indicates that sediments of most aquatic ecosystems were considerably to highly contaminated. The results illustrate that the proposed index is reliable, precise, and in good agreement with similar existing indexes for evaluating the severity of sediment-associated contamination by heavy metals. The principal component analysis (PCA) and factor analysis indicate that heavy metals in the benthic sediments originate mostly from anthropogenic sources.

Keywords: Fractionation, heavy metals, sediment, sediment pollution, contamination index.

1. Introduction

Sediments are integrated components of aquatic ecosystems, and have been recognised as sinks of heavy metals (Addo et al., 2012; Benson et al., 2008, 2016a; Benson & Etesin, 2008; Nilin et al., 2013; Pejman et al., 2015). Heavy metal concentration data are commonly applied in monitoring and assessing the degree of contamination of aquatic environments using sediment quality indices (Ajibola & Ladipo, 2011; Goher et al., 2014; Harikumar & Nasir, 2010; Håkanson, 1980; Kazemi et al., 2012; Lin et al., 2013; Liu et al., 2014; Maanan et al., 2015). Reports indicate that heavy metals in sediments could pose considerable adverse effects on aquatic animals, plants and the environment due to their bioaccumulation potential, non-biodegradability, and toxicity (Abreeu et al., 2016; Benson et al., 2013, 2016b; Bu-Olayan & Thomas, 2013; Chen et al., 2016; Ma et al.,

2016; Morelli & Gasparon, 2014; Tornero et al., 2014; Zhan et al., 2016). Several empirical and statistical indexes have also been developed as contamination assessment tools for monitoring sediments in aquatic ecosystems. Sediment quality indexes developed and widely applied in assessment of heavy metal contamination in aquatic ecosystems include risk assessment code (Håkanson, 1980), ecological risk index (Perin et al., 1985), pollution load index (Tomlinson et al., 1980), modified degree of contamination (Abrahim & Parker, 2008), modified risk assessment code (Saeedi & Jamshidi-Zanjani, 2015), and contamination severity index (Peiman et al., 2015). Although these approaches of characterizing sedimentary contamination hazards have existed since the early 80's and are widely accepted and employed in sediments associated studies, each of these indices and reference values has its peculiar reliability advantages and limitations.

In this study, a new composite index, ecological contamination index, ECI, has been developed and proposed as sediment quality assessment approach, based on the assimilation of heavy metal concentration data from SEM in sediments from multiple tropical estuaries and freshwater ecosystems off the Equatorial Atlantic Ocean. This report provides a better understanding of the metal pollution status in aquatic ecosystems.

2. Materials and Method

2.1 Study Area and Sampling

In this study, five mesotidal and intertidal coastal water systems were considered. The aquatic ecosystems include Douglas Creek (DOU), Okorotip Creek (OKT), Stubbs Creek (STB), Qua Iboe Estuary (QUE) and Qua Iboe River (QUR). Sampling sites within the water bodies of these ecosystems were clearly mapped and designated for the collection of benthic sediments during the dry (June-August) and wet (November-January) seasons of the year. Benthic sediment samples from each ecosystem were collected using a modified van Veen (0.1 m²) grab sampler and were preserved in clean, well-labelled glass bottles. After collection, the samples were all stored in ice-packed coolers and transported to the laboratory. These samples were further refrigerated in the laboratory at 4°C to inactivate microbes and to preserve the integrity of the samples prior to analysis. A total of 90 benthic sediment samples were collected. In the laboratory, the sediment samples were dried in an oven maintained at $105\pm0.5^{\circ}$ C, homogenized, comminuted using a hand mortar and sieved using a 2 mm mesh sieve prior to leaching (Radojevic & Baskin, 1999). Coning and quartering method was used to obtain subsamples from the respective composite samples.

2.2 Sample Extraction, Instrumentation and Data Analysis

The Tessier's procedure (Table 1) designed to separate heavy metals into five operationally defined fractions: exchangeable (F1), carbonate bound (F2), Fe-Mn oxides bound (F3), organic bound (F4) and residual fractions (F5) was used for this study (Tessier *et al.*, 1979). The determinations of cadmium (Cd), copper (Cu), chromium (Cr), lead (Pb) and nickel (Ni) were performed using inductively coupled plasma spectrophotometer (ICP-AES). The detection limits were 0.02, 0.01, 0.02, 0.02 and 0.01 ppm for Cd, Cr, Cu, Pb and Ni, respectively. Data analyses were carried out with XLSTAT-Pro software (AddinSoft Inc. USA).

2.3 Degree of Contamination and Modified Degree of Contamination

The degree of contamination, DC, was calculated with the sole aim of elucidating information on the potential risks posed by the presence of multiple heavy metals in sediments (Cheng *et al.*, 2013; Hou *et al.*, 2013). In this study, the DC was calculated according to the formula developed by Håkanson (1980):

$$DC = \bigsqcup_{i=1}^{i=n} CF_i \qquad \text{where} \quad CF_i = \bigsqcup_{i=1}^{\square} C_{ikg}^{\square} \qquad (2)$$

where CF_i = the contamination factor of metal i, C^i_{mc} = the mean concentration derived from investigated heavy metals from the five sampling sites, C^i_{bkg} = the background value of individual metal. The DC is classified into: low contamination (DC \leq 6), moderate contamination (6 < DC \leq 12), considerable contamination (12 < DC \leq 24), and very high contamination (24 > DC). The modified degree of contamination commonly denoted as *mCd* is an empirical and generalized form of the Håkanson's formulae (equation 3) (Håkanson, 1980), used by Abrahim

Table 1. Tessier's procedure for chemical fractionation

(2008) to determine the net contamination magnitude associated with heavy metals at any specific study location. mCd is expressed as follows:

$$mCd = \frac{\overset{i=n}{\circ} CF_i}{n}$$
(3)

where CF_i = contamination factor, n = the number of analysed metals, and i = ith metal. The following classifications and descriptions of mCd are adopted for the present study: mCd < 1.5 refers to nil to very low contamination; $1.5 \le mCd < 2$ indicates low contamination; $2 \le mCd < 4$ implies moderate contamination; $4 \le mCd < 8$ indicates high contamination; $8 \le mCd < 16$ means very high contamination; $16 \le mCd < 32$ implies extremely high contamination and $mCd \ge 32$ refers to ultra high degree of contamination (Maanan *et al.*, 2015).

3. Results and discussion

3.1 Heavy Metal Concentration

The fractionation metal concentrations indicate that Pb shows the highest mean concentration in the sediment during both seasons, followed by Cu. The maximum mean concentration values for Cd (5.67 mg kg⁻¹), Cr (28.52 mg kg⁻¹), Cu (43.72 mg kg⁻¹), Ni (2.60 mg kg⁻¹), and Pb (190.37 mg kg⁻¹) are obtained in the benthic sediments for both seasons. Mean metal levels (mg kg⁻¹) during wet and dry seasons did not show significant variability at all sites. Intensive fishing activities, sewage drainage from the mainland and other industrial activities are possible potential sources for the enrichment of these elements during the two seasons.

3.2 Degree of contamination and modified degree of contamination

The degree of contamination (DC) for Qua Iboe estuary, river and associated creeks were generally greater than 24, thus indicating very high degree of contamination. However, the severity of the heavy metals contamination followed the trend QUR > QUE > DOU > OKT > STB.

| Extraction step | Fractionation phase | Nominal target phase | Reagents | | | | |
|-----------------|---------------------|------------------------------|--|--|--|--|--|
| Step 1 | Fraction A | Exchangeable metals | $MgCl_2$ (1.0 mol/dm ³) | | | | |
| Step 2 | Fraction B | Carbonate bound | NaOAc (1.0 mol/dm^3) at pH = 5.0 | | | | |
| Step 3 | Fraction C | Oxides Fe/Mn | NH2OH.HCl (0.04 mol/dm ³) / CH3COOH (4.4 mol/dm ³) | | | | |
| Step 4 | Fraction D | Organic matter and sulphides | $HNO_3~(0.02\ mol/dm^3)$ / $H_2O_2~(12.8\ mol/dm^3);$ then $NH_4OAc~(3.2\ mol/dm^3)$ at $pH=2.0$ | | | | |
| Step 5 | Fraction E | Residual bound to silicates | HF/HClO ₄ ; then HCl (3.0 mol/dm ³) | | | | |

Table 2. Modified degree of contamination by analysed trace metals

| | June | July | August | November | December | January | |
|-----|------|------|--------|----------|----------|---------|--|
| DOU | Н | Н | Н | Н | Н | Н | |
| OKT | Н | Н | Н | Н | Н | Н | |
| STB | Н | Н | Н | Н | Н | Н | |
| QUE | Н | Н | Н | Н | Н | Н | |
| QUR | Н | Н | Н | Н | Н | Н | |

H: High degree of contamination

Additionally, the monthly DC values for all metals ranged between 25.63 and 27.31 with the wet season recording higher values than the dry season. The tidal influence within these aquatic ecosystems is usually remarkable during the wet season. The contamination ranking of heavy metals based on percent contribution to DC was Cd>Pb>Cu>Cr>Ni. Also, the *mCd* values obtained for all investigated heavy metals in benthic sediments ranged between 4.86 and 5.55, further indicating that the ecosystems are characterized by high degree of contamination during both seasons (Table 2).

3.3 Principal Component Analysis

3.4 The rotated factor loadings of principal component (PCA) conducted to evaluate analysis the interrelationships of trace metals in benthic sediments from the five studied aquatic ecosystems are presented in Table 3. The different trace metals contamination behaviours are observed in all five studied ecosystems. As shown in Table 3, there are two principal components (PC1 and PC2) for sedimentary heavy metals at the DOU, OKT, STB, QUE and QUR sites. Multivariate statistical analyses using PCA show that heavy metals pollution in these ecosystems originate from two principal sources - anthropogenic and lithogenic sources. The 1st principal component (PC1) metal contamination indicates heavy from anthropogenic sources, while the second principal component (PC2) represents natural sources of contamination. Cd, Pb and Cu may have common human-induced sources such as industrial and vehicular related activities. More so, Cr and Ni indicate a mixed origin from natural rock weathering processes and anthropogenic on- and off-shore-based

industrial related activities. *Newly developed* contamination index

3.4.1 Ecological Contamination Index (ECI)

In this study, we proposed a reliable index known as ECI for an overall ecological risk assessment of sediment contamination by heavy metals. The ECI is an aggregative empirical approach that estimates the risks associated with an ecosystem using a source-specific factor derived primarily from principal component analysis/factor analysis. The proposed formula for ECI is mathematically expressed as:

$$ECI = B_n \bigcap_{i=1}^n mHQ_i$$
(5)
$$mHQ = C_i \bigcap_{i=1}^{1/2} \frac{1}{SQG_i} \bigcap_{i=1}^{1/2}$$
(6)

where B_n = the reciprocal of derived eigenvalue of heavy metal concentrations only. mHQ = the modified hazard index, and SQG = the metal toxicity threshold, probable, and severe effect factors (MacDonald et al., 2000). The proposed ranking of risks posed by heavy metals to ecological systems computed based on the proposed formulation is presented in Table 4. The multi-elemental potential ECIs for all sites are 4.06, 3.80, 3.46, 5.06, and 3.73 for sites QUE, QUR, OKT, DOU, and STB, respectively. The calculated ECIs indicate that the ecosystems are characterized by slightly contaminated to a highly contaminated degree of pollution. The ecological risk ranking based on percentage contribution to ECI followed the sequence Cd>Pb>Cu>Cr>Ni, while the severity of ecosystem pollution based on the six heavy metals decreases in the following sequence: DOU> QUE>QUR>STB>OKT.

Table 3. Loadings of two principal components for benthic sediment variables

| | DOU | | OKT | | STB | | QUR | | QUE | |
|-----------------|--------|--------|--------|--------|--------|--------|--------|--------|--------|--------|
| | PC1 | PC2 |
| Load of Cd | 0.634 | 0.452 | 0.234 | 0.936 | 0.953 | 0.114 | 0.576 | 0.734 | 0.484 | -0.758 |
| Load of Cr | 0.160 | 0.345 | -0.786 | 0.508 | 0.439 | -0.635 | -0.682 | 0.459 | 0.485 | 0.708 |
| Load of Cu | 0.750 | -0.144 | 0.943 | -0.002 | 0.907 | -0.252 | 0.821 | -0.149 | -0.832 | -0.068 |
| Load of Ni | 0.125 | 0.558 | 0.368 | -0.095 | 0.623 | 0.716 | 0.467 | 0.865 | 0.522 | -0.431 |
| Load of Pb | -0.401 | 0.587 | -0.817 | -0.265 | -0.060 | 0.783 | 0.662 | -0.590 | 0.913 | 0.210 |
| Eigenvalue | 1.705 | 1.601 | 2.366 | 1.214 | 2.317 | 1.605 | 2.128 | 1.868 | 2.268 | 1.311 |
| Variability (%) | 34.108 | 32.022 | 47.314 | 24.275 | 46.337 | 32.110 | 42.565 | 37.360 | 45.365 | 26.226 |
| Cumulative % | 34.108 | 66.130 | 47.314 | 71.589 | 46.337 | 78.447 | 42.565 | 79.925 | 45.365 | 71.591 |

 Table 4. Ecological contamination index categorizations

| ECI | Degree of contamination | | | | |
|---------------------------|---|--|--|--|--|
| ECI > 7 | Extremely contaminated | | | | |
| $6 \leq ECI < 7$ | Highly contaminated | | | | |
| $5 \leq ECI < 6$ | Considerably to highly contaminated | | | | |
| $4 \leq \mathrm{ECI} < 5$ | Moderately to considerably contaminated | | | | |
| $3 \leq \mathrm{ECI} < 4$ | Slightly to moderately contaminated | | | | |
| $2 \leq \mathrm{ECI} < 3$ | Uncontaminated to slightly contaminated | | | | |
| ECI < 2 | Uncontaminated | | | | |

Again, Cd contributes significantly to the ecological contamination risk index of these ecosystems than other heavy metals. The reliability and accuracy of the newly proposed formulae for assessment of sediment-associated heavy metals in aquatic ecosystems were ascertained by a thorough comparison of calculations using existing pollution indices. Results indicate that the ECI is a reliable and useful pollution tool that can be used to estimate the extent of pollution, site-specific status and aggregative contamination effects by heavy metals in aquatic ecosystems.

4. Conclusion

Heavy metals levels and contamination status in benthic sediments of five equatorial estuarine and riverine ecosystems are evaluated using existing pollution indices. Newly proposed index is used to evaluate the holistic ecological severity risk of sediment-associated heavy metals. The ECI is an aggregative index that represents the overall contamination pedigree and associated ecological risks based on the contribution of all hazardous heavy metals in an aquatic ecosystem. The risk assessment indices employed in the present study reveal significant contamination risk by Cd and Pb. The PCA reveals that both anthropogenic and lithogenic sources are responsible for the possible contamination of the investigated ecosystem by Cd, Cr, Cu, Ni and Pb. Estimation of potential risks by metals using the proposed ECI reveals possible pollution hotspot sites. A comparison of the newly proposed indices with existing pollution indices reveals very good agreement.

References

- Abrahim, G.M.S. and Parker, R.J. (2008). Assessment of heavy metal enrichment factors and the degree of contamination in marine sediments from Tamaki Estuary, Aukland, New Zealand, *Environ. Monit. Assess.*, 136, 227–238, 2008.
- Abreu, I. M., Cordeiro, R. C., Soares-Gomes, A., Abessa, D. M. S., Maranho, L. A. and Santelli, R. E. (2016). Ecological risk evaluation of sediment metals in a tropical Euthrophic Bay, Guanabara Bay, Southeast Atlantic, *Marine Pollution Bulletin*. http://doi.org/10.1016/j.marpolbul.2016.05.030
- Addo, M., Affum, H., Botwe, B.O., Gbadago, J.K., Acquah, S., Senu, J.K., and Mumuni, I.I. (2012). Assessment of Water Quality and Heavy Metal Levels in Water and Bottom Sediment Samples from Mokwé Lagoon, Accra, Ghana, *Research Journal of Environmental and Earth Sciences*, 4 (2), 119–130.
- Ajibola, V.O. and Ladipo, M.K. (2011). Sediment quality of effluent discharge channelsfrom six industrial sites in Lagos, Nigeria. *Int. J. Environ. Res.* 5, 901–908.
- Benson, N.U. and Etesin, M.U. (2008). Metal contamination of surface water, sediment and Tympanotonus fuscatus var. radula of Iko River and environmental impact due to Utapete gas flare station, Nigeria, *Environmentalist*, 28, 195–202.
- Benson, N.U., Asuquo, F.E., Williams, A.B., Essien, J.P., Ekong, C.I., Akpabio, O. and Olajire, A.A. (2016a). Source evaluation and trace metal contamination in benthic 1 sediments from equatorial ecosystems using multivariate statistical techniques. *PLoS ONE* 11(6), 1-19. doi:10.1371/journal.pone.0156485
- Benson, N.U., Anake, W.U., Essien, J.P., Enyong, P.A. and Olajire, A.A. (2016b). Distribution and risk assessment of trace metals in *Leptodius exarata*, surface water and

sediments from Douglas Creek, Qua Iboe estuary. *Journal of Taibah* University for Science, ttp://dx.doi.org/10.1016/j.jtusci.2016.08.004

- Benson, N.U., Anake, W.U. and Olanrewaju, I.O. (2013). Analytical relevance of trace metal speciation in environmental and bio-physicochemical systems. *American J. Anal Chem*, 4, 633-641.
- Benson, N. U., Udosen, E. D., and Akpabio, O. (2008). Interseasonal distribution and partitioning of heavy metals in subtidal sediment of Qua Iboe Estuary and associated Creeks, Niger Delta (Nigeria). *Environmental Monitoring & Assessment*, 146, 253-265
- Bu-Olayan, A.H. and Thomas, B.V. (2013). Effect of trace metals levels in waste water discharges, sediment and Euchelus asper in Kuwait marine environment. *Int. J. Environ. Res.* 7, 779–784.
- Chen, H., Chen, R., Teng, Y. and Wu, J. (2016). Contamination characteristics, ecological risk and source identification of trace metals in sediments of the Le'an River (China). *Ecotoxicology and Environmental Safety*, 125, 85-92. doi:10.1016/j.ecoenv.2015.11.042
- Cheng, Z., Man, Y.B., Nie, X.P. and Wong, M.H. (2013). Trophic relationships and health risk assessments of trace metals in the aquaculture pond ecosystem of Pearl River Delta, China. *Chemosphere*, 90, 2142–2148.
- Goher, M.E., Farhat, H.I., Abdo, M.H. and Salem, S.G. (2014). Metal pollution assessment in the surface sediment of Lake Nasser, Egypt. *Egyptian Journal of Aquatic Research*, 40, 213–224.
- Harikumar, P.S. and Nasir, U.P. (2010). Ecotoxicological impact assessment of heavy metals in core sediments of a tropical estuary. *Ecotoxicology and Environmental Safety*, 73 (7), 1742–1747.
- Håkanson, L. (1980). Ecological risk index for aquatic pollution control, a sedimentological approach. Water Res. 14, 975– 1001.
- Hou, D., He, J., Lü, C., Ren, L., Fan, Q., Wang, J. and Xie, Z. (2013). Distribution characteristics and potential ecological risk assessment of heavy metals (Cu,Pb,Zn,Cd) in water and sediments from Lake Dalinouer, *China. Ecotox. Environ. Safety*, 93, 135-144.
- Kalender, L. and Çiçek Uçar, S. (2013). Assessment of metal contamination in sediments in the tributaries of the Euphrates River, using pollution indices and the determination of the pollution source, Turkey. *Journal of Geochemical Exploration*, 134, 73–84.
- Kazemi, A., Bakhtiari, A.R., Kheirabadi, N., Barani, H. and Haidari, B. (2012). Distribution patterns of metals contamination in sediments based on type regional development on the intertidal coastal zones of the Persian Gulf, Iran. Bull. Environ. Contam. Toxicol. 88, 100–103.
- Lin, Y. C., Chang-Chien, G. P., Chiang, P. C., Chen, W. H. and Lin, Y.C. (2013). Multivariate analysis of heavy metal contaminations in seawater and sediments from a heavily industrialized harbor in Southern Taiwan, *Marine Pollution Bulletin*, 76(1-2), 266–275.
- Liu, J., Wu, H., Feng, J., Li, Z. and Lin, G. (2014). Heavy metal contamination and ecological risk assessments in the sediments and zoobenthos of selected mangrove ecosystems, South China. *Catena*, 119, 136–142.
- Ma, X., Zuo, H., Tian, M., Zhang, L., Meng, J., Zhou, X. and Liu, Y. (2016). Assessment of heavy metals contamination in sediments from three adjacent regions of the Yellow River using metal chemical fractions and multivariate analysis

techniques, *Chemosphere*, 144. http://doi.org/10.1016/j. chemosphere.2015.08.026

- Maanan, M., Saddik, M., Maanan, M., Chaibi, M., Assobhei, O. and Zourarah, B. (2015). Environmental and ecological risk assessment of heavy metals in sediments of Nador lagoon, Morocco, *Ecological Indicators*, 48, 616–626.
- MacDonald, D.D., Ingersoll, C.G., Berger, T.A. (2000). Development and evaluation of consensus-based sediment quality guidelines for fresh- water ecosystems. *Arch Environ Contam Toxicol*, 39, 20–31.
- Morelli, G. and Gasparon, M. (2014). Metal contamination of estuarine intertidal sediments of Moreton Bay, Australia. *Marine Pollution Bulletin*, 89(1-2), 435–443.
- Nilin, J., Moreira, L.B., Aguiar, J.E., Marins, R., Souza, D.M., Abessa, T., Cruz Lotufo, M.,Costa-Lotufo, L.V. (2013). Sediment quality assessment in a tropical estuary, the case of Ceará River, Northeastern Brazil, *Mar. Environ. Res.*, 90, 1– 8.
- Pejman, A., Nabi, G. and Ardestani, M. (2015). A new index for assessing heavy metals contamination in sediments: A case study, *Ecological Indicators*, 58, 365–373.
- Perin, G., Craboledda, L., Cirillo, M., Dotta, L., Zanette, M.L., *et al.* (1985). Heavy metal speciation in the sediments of Northern Adriatic Sea: a new approach for environmental toxicity determination. In: Lekkas TD, editor. Heavy Metal in the Environment. CEP Consultant, Edinburgh 2. pp. 454– 456.
- Radojevic, M. and Bashkin, V.N. (1999). Practical Environmental Analysis. Royal Society of Chemistry, 465pp.
- Saeedi, M. and Jamshidi-Zanjani, A. (2015). Development of a new aggregative index to assess potential effect of metals pollution in aquatic sediments, *Ecological Indicators*, 58, 235–243.
- Tessier, A., Campell, P. and Bison, M. (1979). Sequential extraction procedure for the speciation of particulate trace metals. *Analytical Chemistry*, 51 (7), 844-850.
- Tomlinson, D.C., Wilson, J.G., Harris, C.R. and Jeffery, D.W. (1980). Problems in the assessment of heavy metals levels in estuaries and the formation of a pollution index, *Helgol Wiss. Meeresunters*, 33, 566–575.
- Tornero, V., Arias, A. M. and Blasco, J. (2014). Trace element contamination in the Guadalquivir River Estuary ten years after the Aznalcóllar mine spill, *Marine Pollution Bulletin*, 86(1-2), 349–360.
- Wang, J., Liu, R., Zhang, P., Yu, W., Shen, Z. and Feng, C. (2014). Spatial variation, environmental assessment and source identification of heavy metals in sediments of the Yangtze River Estuary. *Marine Pollution Bulletin*, 87, 364– 373
- Zhang, Z., Juying, L., & Mamat, Z. (2016). Sources identification and pollution evaluation of heavy metals in the surface sediments of Bortala River, Northwest China. *Ecotoxicology and Environmental Safety*, 126, http://doi.org/10.1016/j.ecoenv.2015.12. 025