

## Development of water quality index of ex-mining ponds in Malaysia

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### Abstract

In this paper, a study on the development of water quality index of ex-mining ponds was carried out for proper assessment and utilization of the abundant ex-mining ponds in Malaysia. Heavy metals were analyzed using inductively coupled plasma mass spectrophotometer (ICPMS), and physico-chemical parameters were analyzed in-situ. Chemometric analysis was successfully applied for the parameter selection process. The water quality index of existing Malaysian river did not accommodate the toxic metal pollutants that dominated in ex-mining water. The acceptable index should therefore incorporate the metal pollutants in order to evaluate the quality status of ex-mining water for human consumption which is the major point of consideration. Two water quality indices were developed to assess the water quality status of ex-mining ponds with reference to Malaysia's water quality standard (INWQS). The heavy metal index was comprised of contribution from Pb, As, and Cd as the selected metals, while the physico-chemical parameter index has BOD, pH, DO, and AN. Chemometric analysis revealed the dominance of the selected heavy metals in ex-mining water, and physico-chemical parameters were important in water quality monitoring. Heavy metal water quality index revealed that most ex-mining ponds in Klang Valley were classified to be very poor hence could not be used for human consumption. Due to domestic input in some of the lakes in Klang Valley, the physico-chemical water quality index was in very poor status as well. In Melaka and Negeri Sembilan, ex-mining ponds and lakes were classified as excellent in both indices.

**Keywords:** Water quality index, chemometric, heavy metals, ex-mining pond, pollution

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## INTRODUCTION

Water quality is an important aspect of human life which illustrates the state or condition of water, which incorporating physical, chemical and biological characteristics, with respect to its acceptability for a specific purpose. There is a global concern on the quality of surface water for consideration as source of supply for human consumption and other domestic needs (Kazi *et al.*, 2009). The environmental status of lakes is depended the type of the lake and its exposure to various factors in the environment. The impairment of water quality is associated with climate change and population growth. Hence, the quality of surface water is not only depended on natural environmental processes such as weathering, erosion and precipitation, but also depended on the influence of anthropogenic activities including urban, agricultural and industrial activities (Khatri and Tyagi, 2015). It is therefore pertinent to monitor and ensure that quality of surface water is assessed for beneficial uses. Water quality index (WQI) provides a simple and concise method for expressing the quality of surface water by the use of single numbers.

Malaysia as a major leading producer and exporter of tin with output of about 40,000 tonnes annually, recorded a huge success and economic gains from 1900 to 1942. The production increased above 50,000 tonnes annually from 1974 to 1980. This significantly has contributed to the industrial development of many countries around

the globe. However, there was no proper environmental monitoring and enforcement during mining operations. This caused environmental degradation and creation of ponds filled with accumulated mining water (Balamurugan, 1991). The early tin mining in Malaysia was concentrated in the Ampang area near Kuala Lumpur, and consequently Selangor became one of the largest tin producers in Malaysia.

The shortage of water for daily human and domestic activities especially in the period of dry season has prompted the search for other sources of water supply. Based on the water crisis in Selangor in the year 2014 and Melaka in 1991 and 2002, this issue is needed to be addressed decisively. The abundant ex-mining ponds in Malaysia with large volumes of water has been suggested to support the daily water demand (Low *et al.*, 2016; Koki *et al.*, 2017). Consequently, consideration must be given to parameters associated with ex-mining water especially the toxic heavy metals that are mostly presented in high concentrations (Ashraf *et al.*, 2011). However, there is no available WQI to assess the water quality status of the ex-mining ponds for its proper utilization. The WQI utilized in Malaysia to evaluate water quality of rivers (equation 1) does not accommodate the heavy metals (DOE, 2012; Low *et al.*, 2016). This has prompted the need to develop an index with the required relevant parameters for proper evaluation and classification of the ex-mining water.

$$WQI = (0.22 * SIDO) + (0.19 * SIBOD) + (0.16 * SICOD) + (0.15 * SIAN) + (0.16 * SISS) + (0.12 * Siph) \quad (1)$$

where;

SIDO = SubIndex DO

SIBOD = SubIndex BOD

SICOD = SubIndex COD

SIAN = SubIndex NH<sub>3</sub>-N

SISS = SubIndex SS

Siph = SubIndex pH

$$0 \leq WQI \leq 100$$

Different WQI's are formulated for various uses including general water quality assessment, specific type of water demand, and water quality management projects. But one of the major challenges in developing WQI is the selection of appropriate parameters that represented the overall water quality (Hernández-Romero *et al.*, 2004). Most WQI developed are subjective in the parameter selection (Lumb *et al.*, 2011), and this affected the suitability of the index for a specific end use (Misaghi *et al.*, 2017). The chemometric analysis employed in this study was aimed to develop a suitable WQI for the accurate assessment of ex-mining ponds for human consumption and other beneficial purposes. Toxic pollutants related to mining, and other environmental/anthropogenic pollutants were taken into consideration.

The objective of this study was therefore to develop WQI for the assessment and classification of ex-mining ponds and lakes. At present, there is no established available WQI that considered both heavy metals and physico-chemical parameters for the purpose of drinking and domestic uses. The study then applied the index to the ex-mining ponds and lakes.

## EXPERIMENTAL

### Study sites

This study was focused on Selangor, Melaka and Negeri Sembilan (Fig. 1) based on their relevance of mining activity in Malaysia, and continuous increase in demand for water supply for daily use (Balamurugan, 1991; Azzlan *et al.*, 2016). The existed variations in geological formations of the underlying rocks were significantly affected the metal levels and distributions (Teh and Kiang, 2002; Ghani *et al.*, 2008; Shirazi *et al.*, 2015). The climate of the study areas was tropical rainforest with abundant rainfall, moderately hot and high humidity (Althuwaynee *et al.*, 2012; Shirazi *et al.*, 2013). Some of the study sites were surrounded by residential units, while some sites were placed far away from the cities. The ponds were mostly utilized for flood retention, agriculture, recreation, and deposition of domestic effluents.

The water samples were collected from ex-mining ponds and lakes in the study sites (Table 1) from September 2015 to October 2016 in the period of low rainfall, and analyzed *in-situ* for pH, DO, EC, TSS and AN using the YSI multiprobe, while BOD was measured using modern water BOD meter. The water samples were preserved at low temperature (4°C) and acidic pH (< 2) for the laboratory analysis. The triplicates of each water sample were filtered using 0.45µm PTFE filters before conducting metal analysis using inductively coupled plasma-mass spectrophotometry (ICP-MS). The filtered water samples were analysed for As, Cd, Pb, Mn, Fe, Na, Mg, and Ca with ICP-MS 7500ce (Agilent Scientific Technology Ltd., USA) (Koki *et al.*, 2017).

### Quality control

All the reagents used in this study were analytical grade. The plastic-wares used were soaked in 15% HNO<sub>3</sub> (v/v), and rinsed twice with ultrapure water (UPW) produced from the PURELAB® UHQ II system (ELGA®, UK). UPW was also used in the preparation of blanks and standard solutions. The multi elemental calibration stock solutions of 1000 mg/L for Fe, Na, Ca and Mg, while 10 mg/L for As, Cd, Pb, and Mn (Agilent Technologies, Newcastle) were used to

prepare the calibration and quality control (QC) solutions by appropriate dilution. The standard reference materials for ICP Certipur® (Merck, Germany), SLR-4 riverine water reference material for trace metals (National Research Council of Canada), and National Institute of Science and Technology standard reference materials for trace elements in water (NIST 1643f, USA) were used to validate and verify the ICP-MS procedure. Blank and QC samples were checked after every ten samples to demonstrate the validity of the previous runs. All analyses were carried out in triplicates and the results were expressed as 95% confidence interval of the mean in µg/L (Koki *et al.*, 2017; Koki *et al.*, 2018).

### Data analysis

The chemometric analyses including principal component analysis (PCA), hierarchical cluster analysis (HCA), and linear discriminant analysis (LDA) applied in the parameter selection were carried out using JMP Pro12. PCA identified the most significant or meaningful parameters in the data set, resulted in reducing the complexity of the data and giving a better understanding of the variation among the parameters (Mustapha *et al.*, 2013). HCA was used on the standardized data set to group similar sampling sites using wards method with euclidean distance as the measure of similarity (Zain *et al.*, 2016). LDA established a discriminant function that could predict the identity of sample group by further confirming the results of HCA and evaluating the variations with respect to the discriminant variables. The water quality index formulation was carried out using MS Excel 2013.



Fig. 1 Map of Malaysia showing the study locations.

### Parameter selection

For water intended for human consumption, priority was given to parameters of health concern (Ashraf *et al.*, 2010), as much concerns had been raised on levels of heavy metals in ex-mining water (Ashraf *et al.*, 2010; Ashraf *et al.*, 2011; Atanacković *et al.*, 2013). In this regard, toxic metals associated with mining were the main focus on the final decision because conventional water treatment processes was only considered and regulated physical-chemical parameters through a sequential process of rapid mixing, flocculation, sedimentation, filtration, and disinfection (Asami *et al.*, 2016; Ayekoe *et al.*, 2017). Similarly, pH, BOD, and DO were considered easily via purified parameters and skillful handling in the water treatment plants (Hou *et al.*, 2016). However, toxic metals were not removed during conventional water treatment processes, but were only removed by using expensive techniques such as forward osmosis, floatation, enhanced ultra-filtration and use of cellulose modified filters (Low *et al.*, 2016; Huang *et al.*, 2017; You *et al.*, 2017). The parameters selected in the development of the WQI of ex-mining ponds were mostly highlighted in previous studies related to the pollutants in mining areas across the world including Malaysia (Yidana and Yidana, 2010; Abbasi and Abbasi, 2012; Gao *et al.*, 2017;). The

experimental results of this study would confirm the presence of these pollutants, especially the toxic heavy metals which were of much priority. Furthermore, PCA, HCA and LDA of the water samples from ex-mining ponds and lakes could justify the parameter selection (Koki et al., 2017). A study on the health risk assessment on exposure to the ex-mining water would also confirm the relevance of the selected parameters (Koki et al., 2018).

Chemometric techniques were applied in the parameter selection, in which the parameters selected for the development of WQI were based on metals that included As, Cd, and Pb while physical-chemical parameters included pH, DO, BOD, and AN. These selected parameters would reflect the general water quality for the intended use, thereby reducing the subjectivity in the parameter selection process that was mostly done by experts in the development of the pioneer and popular existing indices (Gupta et al., 2013).

**Weightage assignment**

Assigning weightage to the selected parameters was an important stage in developing WQI as it entailed in assigning a significance or priority in the form of a numerical value to the individual parameters in accordance with the contribution to the overall water quality (Bhutiani et al., 2016). The standard permissible values of the parameters in Malaysian water quality standard INWQS were used to assign the weightages that added up to 1. The selected parameters and the allocated weightages respectively for metals and physical-chemical parameters were shown in Tables 2 and 3. From Table 2, it could be inferred that toxic heavy metals associated with mining have a total relative weight of 453 which was by far greater than 3.98 for the physical-chemical parameters as shown in Table 3. The high relative weight of metals was due to the low standard permissible values in drinking water (DOE, 2012; MOH, 2004). The assigned weightage factors of the metal pollutants were 0.74, 0.22, and 0.04 for Cd, As, and Pb respectively. The weightage was given by equation 2;

$$W = \frac{K}{S} \tag{2}$$

where W is the weightage, K is proportionality constant, and S is the parameter standard permissible value (Jha et al., 2015; Saeedi et al., 2010).

Equation 2 could be rewritten as follows;

$$K = \frac{1}{\sum \frac{1}{S}} \tag{3}$$

**Subindex/quality rating**

Sub-indices could transform different units of the water quality parameters into a common scale (MERC, 2012). The quality rating of each selected parameter could be achieved either by using mathematical equations or rating curves formulated by opinion of the selected water quality experts. Several researchers pointed the highly subjective nature of the rating curves (Cude, 2001; Boyacioglu, 2007). Similarly, the use of sub-index rating based on the personal opinion of 14 water quality experts in the formulation of the universal water quality index was reported (Vasanthavigar et al., 2010). However, quality rating using observed experimental values (primary data) was applied to obtain the sub-indices in this study. It was actually the ratio of the parameter concentration in the water sample to the standard permissible value (Abbasi and Abbasi, 2012), as given in equations 4 and 5 below. This was more acceptable by considering that water from the ex-mining ponds was proposed for human consumption.

$$Q_i = \frac{C_i}{S_i} \times 100 \tag{4}$$

$$Q_{pH, DO} = \frac{C_i - V_i}{S_i - V_i} \times 100 \tag{5}$$

where  $C_i$  is the parameter concentration in mg/L,  $S_i$  is the standard parameter value in INWQS,  $V_i$  is the ideal value which is considered as 7.0 for pH, and 14.6 for DO. The sub-index was further computed using equation 6.

$$SI_i = W_i \times Q_i \tag{6}$$

The sub-indices of the selected parameters in ex-mining ponds and lakes were shown in Tables 4 and 5.

**Table 1** Description of the study areas.

Type	Location	Area	Code	Coordinate
Ex-mining pond	Selangor	Puchong	TSP	N 02° 56' 50.4" E 101° 34' 37.2"
			TPPA	N 02° 57' 27.8" E 101° 36' 52.2"
			TPPB	N 02° 57' 46.4" E 101° 36' 21.8"
			TPRP	N 02° 59' 10.0" E 101° 35' 49.4"
		Titiwangsa	TT	N 03° 10' 35.3" E 101° 42' 21.3"
		Kelana Jaya	TKJA	N 03° 05' 35.4" E 101° 35' 53.2"
			TKJB	N 03° 05' 57.1" E 101° 35' 40.9"
		Gombak	TB	N 03° 14' 50.9" E 101° 31' 38.6"
	Melaka	Jasin	TBC1	N 02° 16' 13.8" E 102° 29' 17.0"
			TBC2	N 02° 16' 15.8" E 102° 29' 37.9"
			TBC3	N 02° 16' 27.3" E 102° 29' 34.6"
	Negeri Sembilan	Rantau	TR	N 02° 31' 00.3" E 101° 57' 47.7"
Lake	Selangor	Petaling Jaya	TTJA	N 03° 06' 17.8" E 101° 38' 53.0"
		Shah Alam	TSA	N 03° 04' 27.0" E 101° 30' 47.3"
			TS7	N 03° 04' 42.4" E 101° 29' 28.7"
		Putrajaya	TPJ	N 02° 55' 12.5" E 101° 40' 52.6"
	Melaka	Kuala Lumpur	TP	N 03° 08' 31.9" E 101° 41' 06.5"
			Jasin	JD
		Alor Gajah	TTB	N 02° 16' 38.0" E 102° 29' 05.5"
			TDT	N 02° 21' 11.4" E 102° 17' 55.6"
Bukit Katil	TBK	N 02° 16' 30.94" E 102° 17' 08.30"		

**Table 2** Weighting factor of the selected heavy metals parameters.

Parameter	Standard Values (INWQS, MOH)	Relative Weight	Assigned Weighting Factor
As	0.01	100	0.22
Cd	0.003	333	0.74
Pb	0.05	20	0.04
<b>Total</b>		<b>453</b>	<b>1</b>

**Table 3** Weighting factor of the selected physical-chemical parameters.

Parameter	Standard Values (INWQS, MOH)	Relative Weight	Assigned Weighting Factor
pH	8.5	0.117	0.03
AN	0.3	3.33	0.84
DO	5	0.2	0.05
BOD	3	0.33	0.08
<b>Total</b>		<b>3.98</b>	<b>1</b>

## RESULTS AND DISCUSSION

### Development of water quality index

From Table 2, it could be inferred that toxic heavy metals associated with mining have a relative weight of 453 which was by far greater than 3.98 for the physical-chemical parameters as shown in Table 3. The assigned weightages factors of the metal pollutants were 0.74, 0.22, and 0.04 for Cd, As, and Pb respectively. This finding was in good agreement with levels of the selected metal pollutants in this study (Fig. 2), and their maximum permissible limits in drinking water. Besides the very high levels of Cd in four of the ex-mining ponds (TPPA, TPPB, TPRP and TT) and lake TPJ, Cd has the least maximum permissible limit in drinking water of 3 µg/L (MOH, 2004; DOE, 2012). AN has the highest weightage of 0.83 in the physical-chemical parameter index and this result agreed with the levels of domestic sewage discharge into the ex-mining ponds and lakes. AN is toxic to humans, animals, and plants, therefore it is not desirable in drinking water (Ashraf *et al.*, 2011; Willingham *et al.*, 2016; Dahlberg *et al.*, 2016). This suggested the suitability of the indices in assessing the quality of water from ex-mining ponds that was predominantly loaded with toxic heavy metals (Atanacković *et al.*, 2013; Ning *et al.*, 2011; Bhuiyan *et al.*, 2010).

The chemometric study using PCA and LDA also revealed that larger variation in ex-mining ponds was associated with the toxic heavy metals. The PC1 and PC2 showed larger variation with 35.6% and 19.2% of the total variance, respectively (Fig. 3). The parameters that have strong positive loading on PC1 were As, Pb, Cd, Mg, EC, and TDS as the major contributors. This indicated that pollution was very much related to the past mining activities. PC2 contained strong negative loading on pH and positive loading on BOD, indicating the dominance of organic matter and domestic discharge (Koki *et al.*, 2017). Similarly, As, Pb and Fe were reported as the most significant parameters in PC1 due to mining (Lumb *et al.*, 2011). Additionally, comparison of the study parameter variations with respect to the sampling sites in Klang Valley and Melaka using HCA revealed high As and Cd concentrations in Klang Valley ex-mining ponds compared to lakes and also higher than all the sites in Melaka (Koki *et al.*, 2018). This was attributed to the differences in the geology of the study areas and the anthropogenic activities. The results of LDA revealed a good sample prediction in which Cd, As, Mn, Mg and DO were associated with ex-mining ponds along the direction of canonical 1, whereas pH, AN, Fe and SS were associated with the lakes. This study also revealed that water samples analyzed from the ex-mining ponds have very low total suspended solid and were not turbid, resulting in clear surface water. This justified the low relative weight associated with the physical-chemical parameters.

The WQI was computed by summing up the sub-indices of the individual parameters to obtain the overall index as shown in equation 7;

$$WQI = \sum SI_i \quad (7)$$

where SI is the sub-index of the individual parameter. The WQI of the ex-mining ponds and lakes with respect to heavy metals (WQI<sub>HM</sub>) was calculated using equation 8 below;

$$WQI_{HM} = 0.74 * SICd + 0.22 * SIAs + 0.04 * SIPb \quad (8)$$

where SIAs is the sub index for As, SICd is sub index for Cd, and SIPb is sub index for Pb.

The WQI for the physical-chemical parameters (WQI<sub>PC</sub>) was calculated using equation 9 below;

$$WQI_{PC} = 0.03 * SIpH + 0.84 * SIAN + 0.08 * SIBOD + 0.05 * SIDO \quad (9)$$

where SIpH is sub index for pH, SIAN is sub index for AN, SIBOD is sub index for BOD, SIDO is sub index for DO.

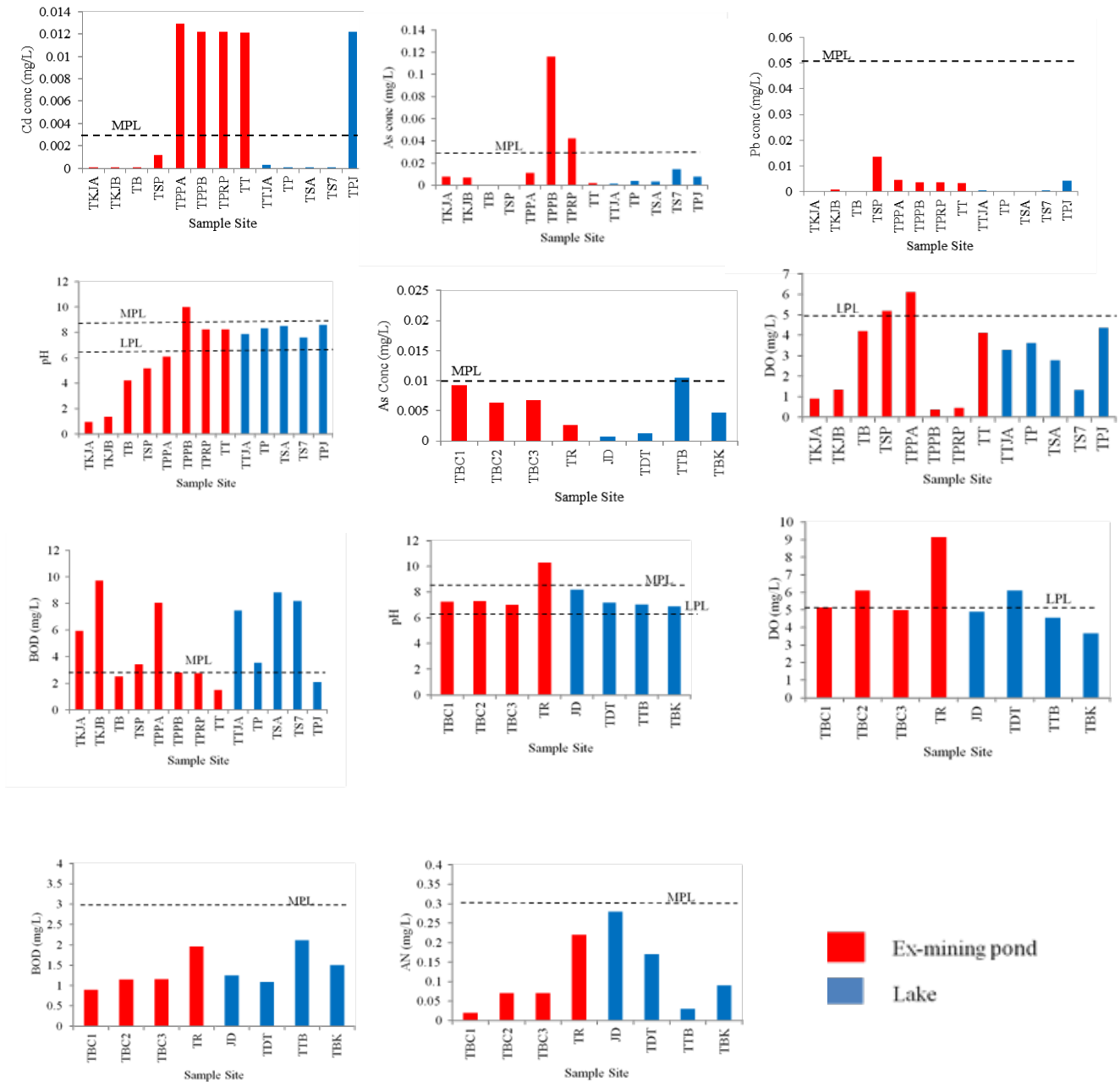
The WQI was classified into five categories as shown in Table 4. The classification was based on decreasing scale in which the water quality was increased along with the decreasing of WQI (Abbasi and Abbasi, 2012). The results of the classification revealed a significant difference in the WQI<sub>HM</sub> values among the sites studied in the Klang Valley ( $p < 0.05$ ). The ex-mining ponds (TPPA, TPPB, TPRP and TT) and lake TPJ were very polluted and rated poor with WQI<sub>HM</sub> of 302–557 and 315, respectively (Table 5). The water was classified as not suitable for human consumption due to high metal loadings. Nevertheless, all other ex-mining ponds and lakes in Klang Valley that having metal pollutants below INWQS limits were rated excellent with WQI<sub>HM</sub> of 1.4–33 as displayed in Fig. 4. Table 6 shows that physical-chemical parameters ratings for all the ex-mining ponds and lakes were Good to Excellent except for TKJB, TTJA, and TS7 with WQI<sub>PC</sub> values of 120, 118, and 163 respectively. These sites were high with organic matter pollution from residences and other anthropogenic inputs (Fig. 5). The dissimilarity in WQI<sub>PC</sub> among the studied sites also confirmed the differences in the pollution sources and influences of external or anthropogenic input. Therefore, WQI<sub>PC</sub> would help to maintain a good water quality of lakes and ex-mining ponds. Conversely, no significant difference was observed in the WQI values of ex-mining ponds and lakes in Melaka. Tables 7 and 8 show WQI<sub>HM</sub> and WQI<sub>PC</sub> as excellent from 4.0–25 and 15–89 respectively where these ratings qualified the water for human consumption after proper conventional water treatment processes (Fig. 6 and Fig. 7).

**Table 4** Water Quality classification.

Range	Water Quality Rating
< 50	Excellent water
50 – 100	Good water
100 – 200	Poor water
200 – 300	Very poor water
> 300	Water unsuitable for drinking purposes

**Table 5** Sub-indices of the selected heavy metals and WQI<sub>HM</sub> of ex-mining ponds and lakes in Klang valley.

Station	As	Cd	Pb	WQI <sub>HM</sub>	Status
TPPA	24.928	316.050	0.396	341.373	Very Polluted
TPPB	255.780	299.635	0.317	555.732	Very Polluted
TPRP	92.610	298.655	0.326	391.591	Very Polluted
TSP	1.477	27.930	1.188	30.595	Excellent
TT	4.697	297.675	0.309	302.681	Very Polluted
TKJA	16.537	0.735	0.020	17.293	Excellent
TKJB	14.994	2.205	0.069	17.268	Excellent
TB	1.169	0.245	0.004	1.418	Excellent
TTJA	2.492	8.085	0.046	10.622	Excellent
TP	8.379	1.470	0.032	9.881	Excellent
TSA	7.431	0.490	0.004	7.925	Excellent
TS7	31.752	1.225	0.058	33.035	Excellent
TPJ	16.537	298.165	0.387	315.089	Very Polluted



MPL = Maximum permissible limit, LPL = Lower permissible limit

Fig. 2 Heavy metal levels and physical-chemical parameters in ex-mining ponds and lakes in Klang Valley, Melaka and Negeri Sembilan.

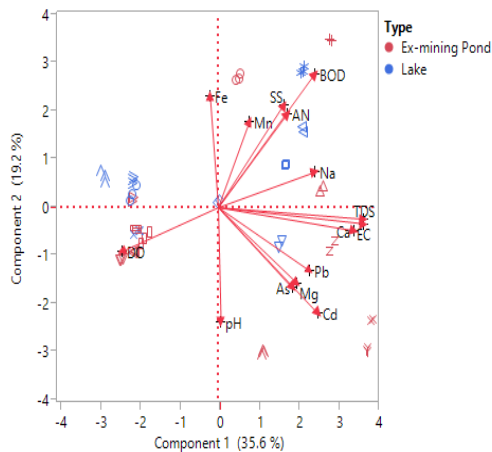


Fig. 3 PCA bi-plot of metals and physical-chemical parameters in ex-mining ponds and lakes in Klang Valley, Melaka and Negeri Sembilan.

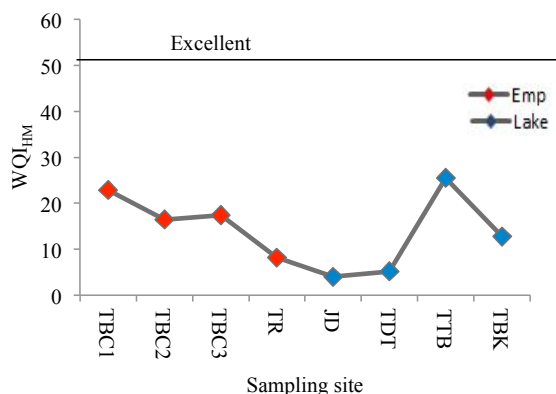


**Table 7** Sub-indices of the selected heavy metals and WQI<sub>HM</sub> of ex-mining ponds and lake in Melaka and Negeri Sembilan.

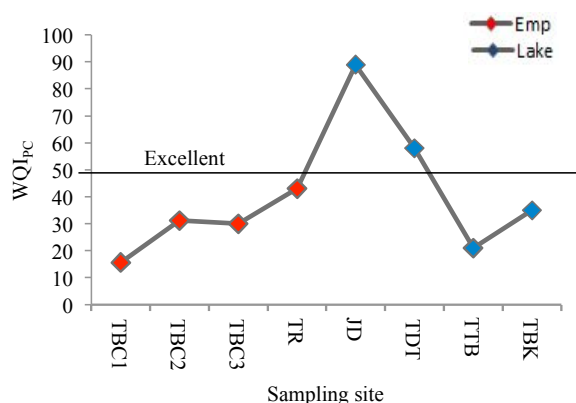
Station	As	Cd	Pb	WQI <sub>HM</sub>	Status
TBC1	20.462	2.45	0.0088	22.921	Excellent
TBC2	14.089	2.45	0.0088	16.548	Excellent
TBC3	14.972	2.45	0.0088	17.431	Excellent
TR	5.777	2.45	0.0088	8.236	Excellent
JD	1.588	2.45	0.0088	4.046	Excellent
TDT	2.822	2.45	0.0088	5.281	Excellent
TTB	23.108	2.45	0.0088	25.567	Excellent
TBK	10.297	2.45	0.0088	12.756	Excellent

**Table 8** Sub-indices of the selected physical-chemical parameters and WQI<sub>PC</sub> of ex-mining ponds and lakes in Melaka and Negeri Sembilan.

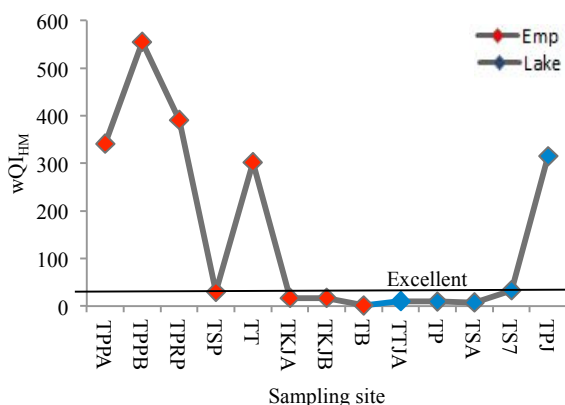
Station	DO	BOD	pH	AN	WQI <sub>PC</sub>	Status
TBC1	5.140	2.490	2.470	5.573	15.673	Excellent
TBC2	6.110	3.182	2.494	19.506	31.292	Excellent
TBC3	4.990	3.209	2.392	19.506	30.098	Excellent
TR	9.160	5.423	3.507	25.080	43.169	Excellent
JD	4.890	3.458	2.797	78.026	89.173	Excellent
TDT	6.090	3.016	2.449	47.373	58.928	Excellent
TTB	4.560	5.865	2.405	8.360	21.190	Excellent
TBK	3.670	4.150	2.347	25.080	35.247	Excellent



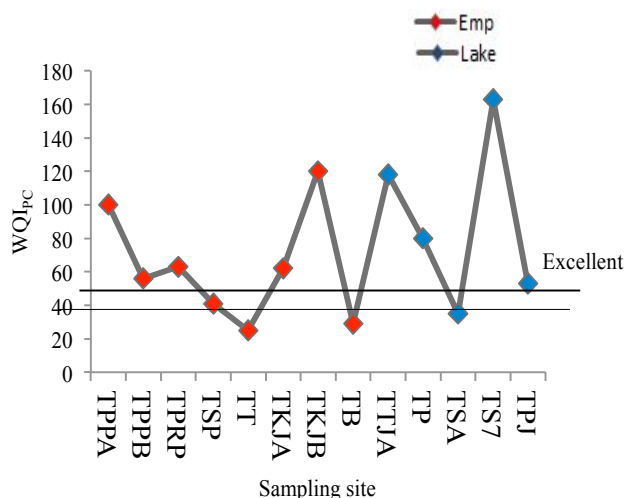
**Fig. 6** Heavy metals WQI<sub>HM</sub> of ex-mining ponds and lakes in Melaka.



**Fig. 7** Physical-chemical parameter WQI<sub>PC</sub> of ex-mining ponds and lakes in Melaka



**Fig. 4** Heavy metals WQI<sub>HM</sub> of ex-mining ponds and lakes in Klang Valley.



**Fig. 5** Physical-chemical parameter WQI<sub>PC</sub> of ex-mining ponds and lakes in Klang Valley.

**Uncertainty in the development of water quality index**

Several WQI have been formulated and efforts have been made to address the limitations observed. All the WQI developed have advantages and limitations, but the limitations could be minimized by reducing the subjectivity (Lumb et al., 2011). Up till now, no single WQI has been accepted globally, but some countries have used combination of water quality data in their formulation. In this study, uncertainty was reduced to the barest minimum level by adopting established water quality guidelines (INWQS) separately for the heavy metals and physical-chemical parameters using chemometric approaches. In a similar way, the statistical approaches improved the accuracy and reliability of the index.

**CONCLUSION**

Water quality index of ex-mining ponds was developed in this study using Malaysian water quality standard as a reference in assigning weightage to the selected parameters. This approach employed the use of primary data and extensive literature comparisons in the parameter selection. Consideration was also given to the geology of the study areas, and anthropogenic inputs into the water bodies for the general water quality assessment. The chemometric and health risks evaluations were included to support the WQI development. Significant variations were observed in the levels of heavy metals and physical-chemical parameters in ex-mining ponds and lakes. This was attributed to the anthropogenic inputs especially in Klang Valley where As and Cd exceeded the reference limit in most ex-mining ponds. High levels of these toxic metals could also be plausibly linked to previous mining activities. As and Cd were the dominant and most important parameters in the metal WQI<sub>HM</sub>, hence ex-mining ponds in Puchong (TPPA, TPPB, and TPRP), Titiwangsa (TT) and Putrajaya lake (TPJ) recorded to have very poor water quality and could not be utilized for drinking purposes but could be

considered as relatively safe for recreational body contact. Other ex-mining ponds and lakes studied in the Klang Valley, Melaka and Negeri Sembilan have heavy metal  $WQI_{HM}$  classification ranging from good to excellent, therefore might be utilized after proper treatment processes. Based on the physical-chemical parameter,  $WQI_{PC}$ , TKJB, TTJA, and TS7 in Klang Valley have poor water quality, hence the need to undergo further purification before utilization was crucial.

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