



# Article Comparison of the Concentration of Risk Elements in Alluvial Soils Determined by pXRF In Situ, in the Laboratory, and by ICP-OES

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Abstract: The aim of the study was to compare the concentrations of risk elements (As, Cu, Mn, Ni, Pb, Zn) in alluvial soil, which were measured by a portable X-ray fluorescence analyser (pXRF) in situ (FIELD) and in the laboratory (LABORATORY). Subsequently, regression equations were developed for individual elements through the method of construction of the regression model, which compare the results of pXRF with classical laboratory analysis (ICP-OES). The accuracy of the measurement, expressed by the coefficient of determination  $(R^2)$ , was as follows in the case of FIELD–ICP-OES: Pb (0.96), Zn (0.92), As (0.72), Mn (0.63), Cu (0.31) and Ni (0.01). In the case of LABORATORY-ICP-OES, the coefficients had values: Pb (0.99), Zn (0.98), Cu and Mn (0.89), As (0.88), Ni (0.81). A higher dependence of the relationship was recorded between LABORATORY-ICP-OES than between FIELD-ICP-OES. An excellent relationship was recorded for the elements Pb and Zn, both for FIELD and LABORATORY (R<sup>2</sup> higher than 0.90). The elements Cu, Mn and As have a worse tightness in the relationship; however, the results of the model have shown its applicability for common use, e.g., in agricultural practice or in monitoring the quality of the environment. Based on our results, we can say that pXRF instruments can provide highly accurate results for the concentration of risk elements in the soil in real time for some elements and meet the principle of precision agriculture: an efficient, accurate and fast method of analysis.

Keywords: soil; alluvial soils; hazardous elements; X-ray fluorescence; the Czech Republic

# 1. Introduction

Soil is a valuable and irreplaceable part of terrestrial ecosystems. Soil quality is a crucial factor for food safety, human health, animal husbandry and the sustainability of all ecosystems. One of the aspects threatening the health and quality of soil is hazardous elements and heavy metals [1–3]. A large number of published studies analysing the risk elements in alluvial soils in the vicinity of rivers, or even in entire flood areas, can be found [1,4–12] because the alluvial soils are specific. Their level of pollution can change relatively quickly, depending on the periodicity and extent of the floods.

Information regarding the concentration of chemical elements in soil needs to be known by many professions, such as scientists, farmers, builders, miners, or environmental workers. The conventional way of determining the concentration of chemical elements in the soil is to take soil samples, transfer them to the laboratory, prepare the samples for analysis, and finally perform the analysis itself. The number of methods for determining a particular element is higher [13] and the choice of analysis depends on the capabilities of the laboratory and its equipment. The atomic-absorption spectroscopy (AAS), atomic fluorescence spectrometry (AFS), and, particularly, inductively coupled plasma optical emission spectrometry (ICP-OES) are the basic methods used for determining the concentration of chemicals in the soil [14,15]. These methods require sample preparation (from relatively simple processes such as drying and grinding to demanding operations involving



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**Copyright:** © 2021 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). the use of chemicals, fume hoods and microwaves), and their acquisition and operating costs are high [16–19]. The high cost of soil analysis is a barrier to the possibility of continuously monitoring soil contamination in large agricultural areas, such as alluvial areas with frequent floods [1,4,7,20]. For this reason, it is appropriate to seek and validate faster and cheaper methods of analysing risk elements in soil, which offer comparable accuracy to the standard laboratory methods already in use [21]. Such a method could be the use of portable analysers with X-ray fluorescence (pXRF), which are able to perform in situ measurements. The applicability of pXRFs is wide. They can be used by archaeologists to analyse archaeological ceramics and sediments [22], and to measure things other than soil, such as the bark and wood of trees in contaminated areas [23], or ethnic spices and cosmetics [24]. However, soil analysis remains the main mission of the pXRFs [25–29]. The pXRF instruments offer an accuracy of determination comparable to laboratory methods (at least, for some elements) [30–32]. Compared to laboratory methods, pXRF instruments are cheaper, faster, easily portable and do not require technical equipment and laboratory staff [32–34]. At the same time, pXRFs can measure the concentration of hazardous elements in the environment with high accuracy, either in situ or in the laboratory [32,35].

The pXRFs have their strengths and weaknesses. Their strengths include their speed of analysis (within minutes, you can analyse a wide range of chemical elements in the soil), user-friendliness and ease of use (almost everyone can use pXRFs), low acquisition and operating costs (compared to laboratory analysers), and relatively high sensitivity and accuracy (especially under suitable conditions). Their weaknesses are the sensitivity and accuracy of the determination, especially in adverse conditions. The main properties of the soil that negatively affect the accuracy of determining the concentration of chemical elements by pXRF are the soil moisture [36,37], together with the soil type and the particle size [38]. Soil moisture increases the absorption of X-rays, thereby reducing the intensity of the X-ray signal. Furthermore, water acts as an element that scatters the incoming X-ray signal. As a result, lower concentrations of chemical elements are recorded in moist soils than in dry soils. According to the U.S. EPA. Method 6200 [39], soil moisture content greater than 20% will significantly affect the measured results. The pXRFs can also be used in laboratory conditions. Using a support stand and prepared samples that have been dried and ground to the required fineness, the accuracy of the analysis increases [37,40]. Lower particles provide higher accuracy as the incident angles are smaller. According to [41] in [42], the soil sieved through a 2 mm sieve provides more accurate results in comparison with unsieved soil samples. On the other hand, this preparation represents the same step as in the case of laboratory analysis using the ICP-OES or AAS. Compared to these two methods, the pXRF measurement in laboratory conditions is very timeconsuming, especially when processing large series of soil samples [40,43]. Another aspect that can affects the measurement results provided by pXRF is spectral interference, an effect common in soils contaminated with heavy metals. An example of this is the relationship between Fe and Cu, where "iron (Fe) tends to absorb copper (Cu) X-rays, reducing the intensity of the Cu measured by the detector" [39]. However, this aspect may not be the rule [43].

Determination of the accuracy of pXRFs measurements is possible by mutual comparison of pXRF, ICP-OES and other analytical methods (AAS, inductively coupled plasma atomic emission spectroscopy (ICP-AES), AFS [32,44–48]). Usually, the concentrations of elements provided by ICP-OES and other laboratory methods are lower (more accurate), while the results provided by the pXRFs can be higher, due to the lower pXRF accuracy [44,46,48] Again, this may not be the rule [43]. According to the [48], very good correlations were recorded in the case of Ca, Cu, Cr, Ni, Pb and Zn, when compared to the results between the *aqua regia* extraction and pXRF in agricultural sites, and in the case of Cd, Cu, Pb, and Zn in industrial sites. The overestimated results can be expected in the case of As and Hg when analysed with the pXRFs [45], but others published satisfactory correlations between lab-based and pXRF measurements for As, Cu and Zn [44]. This shows that the pXRF analysers are not perfect and have their limits, primarily bing affected by the soil moisture content [47]. On the other hand, the high degree of correlation of results with lab-based methods, ease and speed of use, and relatively low cost of analysis (compared to the lab methods) make pXRFs a great instrument for many research industries and environmentalists. As mentioned above, the pXRF accuracy of the measurement can be increased in laboratory conditions, when soil samples are dried and grounded. This is an option for scientists or companies (authorities) without lab equipment, who want to obtain more accurate results [37,40].

In this paper, we compared the results of the soil analyses, concentrations of As, Cu, Mn, Ni, Pb, and Zn measured by pXRF (recorded in situ and laboratory) and ICP-OES. The results analyse 43 sites around the Mže and Otava rivers, where alluvial soils, influenced by the long mining history in the surrounding areas, are mainly used as agricultural soils today.

#### 2. Materials and Methods

## 2.1. Site Description

In 2018 and 2019, we conducted soil research near two rivers, the Mže and the Otava, including their floodplains. Both rivers originate in Bavaria, Germany, where our colleagues from the Bavarian Environment Agency also analysed the basins of these rivers. The length of the Mže river basin (Mies in German, Misa in Latin) is 106.5 km in the Czech Republic and the catchment area is 1828.6 km<sup>2</sup>. The Otava River (Wottawa in German) is a goldbearing river, 111.7 km long, and the catchment area is 3840 km<sup>2</sup>. In the past, both the rivers and their surroundings were closely associated with mining and ore processing. We selected a total of 43 sites in the Czech Republic, where we performed 36 soil exploration test pits and 106 satellite test pits. The analysed sites represent both agricultural land and currently unused land. From these soil probes, we took a total of 502 soil samples, which represented their soil horizons. According to [49], the soil type is Fluvisol and the whole studied area of the catchment area of both rivers is characterized as a floodplain, where N—year flow rates = Q100 m<sup>3</sup>s<sup>-1</sup>.

## 2.2. Experiment Description

A total of three different methods of analysis are compared in this article. The first method is an in situ soil analysis performed using the pXRF (Niton<sup>TM</sup> XL3t Gold plus, Thermo Fisher Scientific<sup>TM</sup> Inc., Waltham, MA, USA). The radiation source is an Ag anode (50 kV voltage max., 2 W max.). The beam opening area is 50 mm<sup>2</sup>. The device was set to the Soil Analysis program, the length of one measurement was 90 s (low, medium and high specters; each analysis took 30 s). The pXRF was calibrated by two standards, the Soil QC Certificate and Mining QC Sheet (Thermo Fisher Scientific<sup>TM</sup>, Waltham, MA, USA). A total of three points were analysed in each soil horizon. After completion of in situ analysis, soil samples were taken from individual horizons for chemical analysis in the laboratory. In the laboratory, soil samples were air-dried and sieved at <2 mm. The samples thus prepared were subsequently analysed by the second and third methods. The second method was pXRF measurement. The individual samples were placed in capsules; the capsules were placed in a rack to which pXRF was attached. The setting and timing of pXRF measurements were the same as for in situ measurements of fresh soil samples. The third method was analysis using a decomposition in digestion vessels mixed with 12 mL of aqua regia [50]. The digestion was performed by MLS 1200 M microwave system (Milestone Inc., Sorisole, Italy). Then, an analysis by ICP-OES followed (ICP-OES Thermo Jarrell Ash, Trace Scan, Franklin, TN, USA).

# 2.3. Statistical Analysis

All analyses were performed using the Statistica 13.3 software (TIBCO Software Inc., Palo Alto, CA, USA), the QC Expert 3.3 Pro (TriloByte Statistical Software Ltd., Pardubice, Czech Republic), and the NCSS 2019 Statistical Software (NCSS, LLC., Kaysville, UT, USA). Linear regression modelling used the regression triplet [51] and consisted of the following

steps: (1) model design, (2) preliminary data analysis (multicollinearity, heteroskedasticity, autocorrelation and influence points), (3) estimation of parameters using the classical least squares method (LSM) and subsequent testing of the significance of parameters using the Student's *t*-test, mean square error of prediction, and Akaik information criterion (AIC), (4) regression diagnostics—identification of influence points and verification of the LSM assumptions, (5) construction of the refined model [51]. The graphical outputs were prepared in OriginPro 2018b (OriginLab Corporation, Northampton, MA, USA). Statistical significance was tested at a significance level of p = 0.05.

## 3. Results

Using linear regression modelling, we analysed the contents of risk elements (As, Cu, Mn, Ni, Pb, and Zn) in the soil, measured by three methods: (1) in situ analysis using the pXRF (marked as FIELD), (2) pXRF used in the laboratory (marked as LABORATORY), and (3) a standard laboratory method using the *aqua regia* followed by ICP-OES spectroscopy (marked as ICP-OES).

## 3.1. Model for Arsen (As)

The equation of the straight line relating As (FIELD) and As (ICP-OES) is estimated as: As (FIELD) = (3.1376) + (0.9859) \* As (ICP-OES) using the 432 observations in this dataset. The y-intercept, the estimated value of As (FIELD) when As (ICP-OES) is zero, is 3.1376, with a standard error of 0.5843. The slope, the estimated change in As (Field) per unit change in As (ICP-OES), is 0.9859, with a standard error of 0.0290. The value of R-Squared, the proportion of the variation in As (FIELD) that can be accounted for by variation in As (ICP-OES), is 0.7295. The correlation between As (FIELD) and As (ICP-OES) is 0.8541. The estimated slope is 0.9859. The lower limit of the 95% confidence interval for the slope is 0.9290 and the upper limit is 1.0428. The estimated intercept is 3.1376. The lower limit of the 95% confidence interval for the intercept is 1.9891 and the upper limit is 4.2861.

The equation of the straight line relating As (LABORATORY) and As (ICP-OES) is estimated as: As (LABORATORY) = (5.7511) + (1.2647) \* As (ICP-OES) using the 459 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 4.5581 and the upper limit is 6.9440 (Figure 1).



**Figure 1.** Statistical significance of regression model for Arsen (pXRF) in soil samples from experimental soil sites from Otava and Mže river basins measured in FIELD and LABORATORY.

	As (pXRF) FIELD	As (pXRF) LABORATORY	Cu (pXRF) FIELD	Cu (pXRF) LABORATORY
Intercept	$3.138\pm0.584$	$5.751\pm0.607$	$17.151 \pm 0.914$	$6.970\pm0.778$
Slope	$0.986\pm0.029$	$1.265\pm0.031$	$0.384\pm0.035$	$1.007\pm0.027$
Residual Sum of Squares	16,463.964	22,110.301	7056.466	21,571.303
Pearson's r	0.854	0.887	0.563	0.898
R <sup>2</sup>	0.729	0.786	0.317	0.807
MEP	39.129	49.248	27.125	0.561
AIC	1576.698	1782.510	871.438	85.573
	Mn (pXRF) FIELD	Mn (pXRF) LABORATORY	Ni (pXRF) FIELD	Ni (pXRF) LABORATORY
Intercept	$62.733 \pm 15.679$	$93.056 \pm 17.722$	$49.910 \pm 5.468$	$22.462\pm1.224$
Slope	$0.687\pm0.024$	$1.139\pm0.027$	$-0.290 \pm 0.244$	$1.713\pm0.070$
Residual Sum of Squares	5,974,539.238	$1.09716  imes 10^{-7}$	40,933.997	22,037.307
Pearson's r	0.799	0.892	-0.100	0.816
R <sup>2</sup>	0.638	0.796	0.010	0.666
MEP	13,375.954	24,382.635	-	73.516
AIC	4276.196	4808.1535	-	1302.888
	Pb (pXRF) FIELD	Pb (pXRF) LABORATORY	Zn (pXRF) FIELD	Zn (pXRF) LABORATORY
Intercept	$-3.697 \pm 1.918$	$4.431 \pm 1.477$	$3.554 \pm 1.567$	$2.028 \pm 1.118$
Slope	$1.149\pm0.010$	$1.527\pm0.009$	$0.731\pm0.010$	$0.977\pm0.008$
Residual Sum of Squares	660,329.315	382,461.348	180,251.141	80,459.575
Pearson's r	0.981	0.992	0.960	0.986
R <sup>2</sup>	0.963	0.984	0.922	0.973
MEP	1408.789	809.513	380.689	173.113
AIC	3528.776	3233.392	2839.733	2412.816

**Table 1.** Model characteristics of the pXRF–FIELD and pXRF–LABORATORY comparison for As, Cu, Mn, Ni, Pb and Zn.

# 3.2. Model for Copper (Cu)

The equation of the straight line relating Cu (FIELD) and Cu (ICP-OES) is estimated as: Cu (FIELD) = (17.1506) + (0.3843) \* Cu (ICP-OES) using the 264 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 15.3500 and the upper limit is 18.9513.

The equation of the straight line relating Cu (LABORATORY) and Cu (ICP-OES) is estimated as: Cu (LABORATORY) = (6.9702) + (1.0072) \* Cu (ICP-OES) using the 328 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 5.4402 and the upper limit is 8.5002 (Figure 2).



**Figure 2.** Statistical significance of regression model for Copper (pXRF) in soil samples from experimental soil sites from Otava and Mže river basins, measured in FIELD and LABORATORY.

Cu /mg kg<sup>-1</sup>/ (ICP-OES)

#### 3.3. Model for Manganese (Mn)

The equation of the straight line relating Mn (FIELD) and Mn (ICP–OES) is estimated as: Mn (FIELD) = (62.7329) + (0.6874) \* Mn (ICP–OES) using the 450 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 31.9191 and the upper limit is 93.5467.

The equation of the straight line relating Mn (LABORATORY) and Mn (ICP-OES) is estimated as: Mn (LABORATORY) = (93.0551) + (1.1388) \* Mn (ICP-OES) using the 473 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 58.2313 and the upper limit is 127.8790 (Figure 3).



**Figure 3.** Statistical significance of regression model for Manganese (pXRF) in soil samples from experimental soil sites from Otava and Mže river basins measured in FIELD and LABORATORY.

## 3.4. Model for Nickel (Ni)

The equation of the straight line relating Ni (FIELD) and Ni (ICP-OES) is estimated as: Ni (FIELD) = (49.9096) + (-0.2900) \* Ni (ICP-OES) using the 140 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 39.0973 and the upper limit is 60.7219.

The equation of the straight line relating Ni (LABORATORY) and Ni (ICP-OES) is estimated as: Ni (LABORATORY) = (22.4618) + (1.7133) \* Ni (ICP-OES) using the 303 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 20.0533 and the upper limit is 24.8702 (Figure 4).



**Figure 4.** Statistical significance of regression model for Nickel (pXRF) in soil samples from experimental soil sites from Otava and Mže river basins measured in FIELD and LABORATORY.

## 3.5. Model for Lead (Pb)

The equation of the straight line relating Pb (FIELD) and Pb (ICP-OES) is estimated as: Pb (FIELD) = (-3.6965) + (1.1493) \* Pb (ICP–OES) using the 489 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is -7.4642 and the upper limit is 0.0711.

The equation of the straight line relating Pb (LABORATORY) and Pb (ICP-OES) is estimated as: Pb (LABORATORY) = (4.4310) + (1.5266) \* Pb (ICP-OES) using the 484 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 1.5284 and the upper limit is 7.3336 (Figure 5).



**Figure 5.** Statistical significance of regression model for Lead (pXRF) in soil samples from experimental soil sites from Otava and Mže river basins, measured in FIELD and LABORATORY.

#### 3.6. Model for Zinc(Zn)

The equation of the straight line relating Zn (FIELD) and Zn (ICP-OES) is estimated as: Zn (FIELD) = (3.5548) + (0.7307) \* Zn (ICP-OES) using the 478 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is 0.4752 and the upper limit is 6.6344.

The equation of the straight line relating Zn (LABORATORY) and Zn (ICP-OES) is estimated as: Zn (LABORATORY) = (2.0281) + (0.9766) \* Zn (ICP-OES) using the 468 observations in this dataset. The y-intercept value, the slope, the Residual Sum of Squares, the Pearson's r, the R<sup>2</sup> value, and the MEP and AIC values are shown in Table 1. The lower limit of the 95% confidence interval for the intercept is -0.1683 and the upper limit is 4.2245 (Figure 6).



**Figure 6.** Statistical significance of regression model for Zinc (pXRF) in soil samples from experimental soil sites from Otava and Mže river basins measured in FIELD and LABORATORY.

#### 3.7. Model Summary

The equations of the lines for the individual risk elements (As, Cu, Mn, Ni, Pb, Zn), with a detailed statistical evaluation, are given in Figures 1-6. The models were processed by regression triplet (data critique, model critique and methods in regression triplet). Therefore, the parameters Mean Prediction Error (MEP) and AAkaike information criterion (AIC) are given in each model. The smaller the AIC or MEP, the more suitable the model. The number of repetitions in single datasets ranges from 140 to 489. The coefficients of determination (R<sup>2</sup>) were 0.96 (Pb), 0.92 (Zn), 0.72 (As), 0.63 (Mn), 0.31 (Cu) and 0.01 (Ni) for in situ measuring (FIELD). For laboratory measurements using the pXRF (LABORATORY), the coefficients were 0.99 (Pb), 0.98 (Zn), 0.89 (Cu, Mn), 0.88 (As) and 0.81 (Ni). All models, except the Ni model (FIELD), were statistically significant (Fisher-Snedecor test) and correct (Scott's multicollinearity criterion). By comparing FIELD and LABORATORY measurements to ICP-OES, a higher tightness of relationships was always recorded between LABORATORY and ICP-OES. For in situ analysis of Ni and Cu concentrations in the soil, the use of pXRF is problematic ( $R^2$  for Ni = 0.01,  $R^2$  for Cu = 0.31). On the contrary, for Pb and Zn, the results are excellent, both for in situ (FIELD) and for LABORATORY measurements ( $\mathbb{R}^2$  higher than 0.9).

Cu, Mn and As show a worse dependence in the models ( $R^2 = 0.75-0.90$ ) than Pb and Zn; however, the pXRF is suitable for orientational survey of environmental quality (assuming analysis in laboratory conditions—LABORATORY). Based on the model, the in situ (FIELD) analysis of Mn and As, as well as Ni in the laboratory (LABORATORY), is suitable for approximate estimation.

# 4. Discussion

The most important parameter observed when comparing the results obtained with pXRF and laboratory methods is the coefficient of determination,  $(R^2)$ . According to the United States Environmental Protection Agency, the results of the analysis obtained by pXRF are divided into three categories, depending on  $R^2$ : (1) definitive, (2) quantitative screening, and (3) qualitative screening. The  $R^2$  parameter is based on the regression between pXRF and the reference data. The range of parameter R<sup>2</sup> for individual categories is as follows: (1) 0.85-1, (2) 0.70-0.85, and (3) <70 [52,53]. When comparing pXRF results obtained from in situ measurements (FIELD) and in-laboratory conditions (LABORATORY), a higher dependence (tightness of the relationship) with the standard laboratory method (ICP-OES) has always been demonstrated by LABORATORY results (see Model Summary). Our results from in situ measurements are similar to the study of Qu et al. [54]. In this paper, pXRF was used to analyse an area of 60 km<sup>2</sup> (agricultural area of Wuhan, Hubei, China), with a soil depth of 20 cm, achieving a correlation coefficient of  $R^2 = 0.95$  for Pb compared to the laboratory method. Similar correlation coefficients for the determination of risk elements using a pXRF, by directly measuring in the field, were also reported by Hu et al. [15], Ran et al. [55], Caporale et al. [48], Zhou et al. [56]; Qu et al. [57]; Kennedy, Kelloway [58].

The accuracy of measuring the concentration of risk elements in the soil will increase if we use pXRF in the laboratory. In this case, the soil samples are sieved, dried and homogenized before the analysis [32]. This step is identical to the preparation of samples for spectroscopic analysis. The prepared soil samples are then poured into plastic capsules. The measurement itself is performed in a stand to which pXRF is attached. However, the increase in sensitivity is redeemed by labor and time. Depending on the number of samples, the analysis may take several days. Our measurements can confirm this, as we achieved higher coefficients of determination in the laboratory (Model Summary). Similar results were published by Wan et al. [32], who analysed agricultural soil around Kunming City, Yunnan Province, southwestern China, and compared the pXRF results measured in the laboratory and then by ICP-MS. Our results are also consistent with the study published by Adler et al. [59]. In this study, a total of 1833 agricultural soil samples in Sweden were analysed and the R<sup>2</sup> coefficients for the elements Cu, Cd and Zn ranged from 0.63 to 0.92. In the case of As, our results are consistent with the results of a study published by Kebonye et al. [60]. In this study, alluvial soil (Fluvisols and Graysols with grass cover) from the Litavka river area, Příbram, the Czech Republic, was measured in the laboratory using the pXRF. This soil is one of the most polluted flood soils in Europe [61]. The use of pXRF in laboratory conditions highlighted the effect of soil moisture, especially for the Ni element (compared to other elements). While in situ measurements could be described as inapplicable or problematic, sample treatment significantly increased the accuracy of the determination.

Based on our research and comparing the results published by other scientists in scientific articles, we can state that measuring the concentration of risk elements in agricultural land using pXRF can provide high-quality (accurate) results, in real time and very quickly (application of precision agriculture principles—efficiency, accuracy and speed [45,48,59,62,63]. pXRF offers a great opportunity for the preliminary monitoring of locally and potentially contaminated soils, followed by standard laboratory analysis [64]. (Kim and Choi 2017). pXRF instruments can also find application in the prediction of soil and soil environment properties, such as pH, carbon content and accessible nutrients [32,35,65,66].

## 5. Conclusions

Using the method of construction of the regression model by regression triplet (data critique, model critique and methods in regression triplet), we compared the concentrations of risk elements in alluvial soils in the basin of two rivers (Mže and Otava). The criteria r (Pearson's r), R<sup>2</sup> (coefficient of determination), MEP and AIC were taken into account in the construction of each model for field results.

The results measured by pXRF (in situ and in the laboratory conditions) were compared with the results obtained by ICP-OES. The number of replicates for individual risk elements ranged from 140 to 489. The coefficients of determination (R<sup>2</sup>) between pXRF in situ and ICP-OES were Pb (0.96), Zn (0.92), As (0.72), Mn (0.63), Cu (0.31) and Ni (0.01). The coefficients of determination between pXRF (in the laboratory) and ICP-OES were Pb (0.99), Zn (0.98), Cu and Mn (0.89), As (0.88) and Ni (0.81). Compared to the standard laboratory method (ICP-OES), a higher tightness of the relationship was always recorded in the case of pXRF laboratory analysis (the accuracy of the in situ pXRF determination was lower).

The use of portable XRF analysers offers faster and simpler analysis than the standard laboratory methods. Speed and simplicity are redeemed by lower accuracy. The accuracy of the determination can be easily increased by the soil sample preparation (drying, grinding, homogenization), followed by pXRF measurement in the laboratory. This method of analysis offers high-quality information on the concentrations of risk elements in the soils.

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