



Communication

A European-Scale Investigation of Soil Erosion Threat to Subsurface Archaeological Remains

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Abstract: This communication emanates from the lack of a European-scale study for investigating the potential threats that subsurface archaeological remains face today due to soil loss by water. This research analyses the impact of soil loss on potential subsurface archaeological evidence by integrating open geospatial datasets deriving from two pertinent European studies. The first study's dataset is related to soil erosion (soil loss provoked by water activity), which was reclassified into three groups alluding the level of threat on potential subsurface archaeological contexts, as follows: (1) areas presenting soil loss from 0 until 5 t/h per year, which are characterised as low threat areas; (2) areas presenting soil loss from 5 until 10 t/h per year, which are characterised as moderated threat; and (3) areas presenting soil loss beyond 10 t/h per year, which are considered as high-risk areas. The second study's dataset refers to the capacity of soils to preserve specific archaeological materials, classified in four categories based on the properties of the archaeological material (bones, teeth, and shells (bones); organic materials (organics); metals (Cu, bronze, and Fe) (metals); and stratigraphic evidence (strati). Both datasets were imported into a Geographical Information System (GIS) for further synthesis and analysis, while the average threat of soil loss per year was evaluated in a country level (nomenclature of territorial units for statistics (NUTS) level 0). The overall results show that approximately 10% of European soils that potentially preserve archaeological remains are in high threat due to soil loss, while similar patterns—on a European level—are found for areas characterised with moderate to high risk from the soil loss. This study is the first attempt to present a proxy map for subsurface cultural material under threat due to soil loss, covering the entire European continent.

Keywords: soil erosion; water erosion; subsurface archaeological remains; soil loss; natural threats; cultural heritage; preservation capacity

1. Introduction

Soil erosion by water is a natural action and a widespread problem throughout Europe and beyond. The activity of soil erosion involves detachment of material by two processes: raindrop impact and flow traction [1]. Scholars discussed soil erosion by water, emphasising the development or assessment of various models, targeted to soil erosion predictions on a local or wider scale [2–9].

Soil erosion models play an important role in soil erosion predictions. Despite the complexity of the phenomenon, various models have been suggested in the past regarding better estimation and prediction of soil loss [10,11]. As Reference [12] argued, in a context where process-based physical models and the availability of input data are not yet mature enough for global-scale applications, empirical methods for predicting soil erosion such as the Revised Universal Soil Loss Equation

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(RUSLE) [13] can provide reasonably accurate estimations for most practical purposes. The RUSLE model is developed based upon five factors: (1) rainfall erosivity factor (R), (2) soil erodibility factor (K), (3) slope length and steepness factor (LS), (4) cover management factor (C), and (5) conservation practice factor (P) for the estimation of the average annual soil loss (A) [14].

While the discussion is still ongoing regarding the improvements of such models, in the last years, soil erosion databases have become accessible on a European level. These models aim to provide a long-term estimation for soil loss by water instead of examining in detail short-periods of soil loss by water. As Reference [15] mentioned, the approach of using large-scale soil erosion modelling is fundamental for decision makers to address common policies and strategies. Models at these scales operating on standard datasets constitute a methodology that provides a basis for estimating soil erosion and identifies areas where detailed studies and remedial measures are needed. Indeed, European and global soil erosion maps and geodata sets are nowadays accessible by the European Soil Data Centre (ESDAC) [16].

As Reference [17] argued, soil erosion remains one of the most important factors that threaten archaeological sites, since both soil loss and soil deposition might alter the archaeological context of an area. Archaeological context refers to visible archaeological sites and standing monuments as well as to areas with potential archaeological interest (still unexcavated subsurface remains). As Reference [18] emphasised, the protection of subsurface archaeological remains—which constitute one of the most vulnerable types of archaeological resources—remains one of the great challenges of heritage management. Although soil erosion has been investigated in the past, since it is a well-known problem that affects archaeological sites or areas with potential archaeological interest, still, there is a limited discussion regarding its quantitative assessment [19,20].

Even though nowadays the documentation of standing monuments via new technologies (e.g., close-range photogrammetry; terrestrial laser scanners, etc. [21,22]) has progressed, the identification of subsurface archaeological areas is still challenging. Over the last years, a plethora of scientific efforts attempted a better detection and characterisation of subsurface archaeological remains through a variety of remote-sensing techniques. The latest include satellite imageries [23,24], aerial observations [25–27], unmanned aerial vehicles (UAVs) [28], and ground-based geophysical prospections [29,30]. In addition, predictive modelling was used through Geographical Information System (GIS) to identify areas with potential archaeological evidence [31].

Whilst reliable assessment to identify potential subsurface archaeological remains is a key component in modern archaeological landscape management [18], the current methods are applicable solely to local-scale assessments. However, a recent research work conducted by Reference [32] has overcome this scale limitation, providing archaeological proxies at a European level. In their study, Reference [32] has classified European soils based on their capacity to preserve potential subsurface archaeological remains. This was achieved by investigating how the various archaeological materials might be affected by the pertinent soil type, according to a standard taxonomic classification. Therefore, soil properties can provide evidence whether a specific soil type can preserve archaeological evidence and on what level, thus predicting the state of preservation of buried archaeological materials, if any, within the specific soil context.

In this study, the authors suggest and visualise a hypothetic analysis of soil loss and the consequent level of threat on subsurface archaeological remains. Towards this direction, the study integrated the works of References [16,32]. While the results of References [16,32] are biased on the uncertainty and assumptions of the models used, the current analysis paves the way to implement extensive-scale studies related to threats of subsurface archaeological materials, being the first one applied on a European level.

This article, therefore, evaluates the soil erosion threat to potential subsurface archaeological remains on a European scale. To do so, existing geodatasets were further processed and integrated into a Geographical Information System (GIS). Considerations on data limitations and accuracy/uncertainty as well as potential future improvements of these datasets are outlined in the Discussion section. The new findings are available for reuse by the scientific community based on open-access policy.

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2. Materials and Methods

2.1. Data Related to the Preservation Capacity of European Soils

Open spatial European datasets related to the capacity of various soil types to preserve archaeological materials and stratigraphic evidence were downloaded from the European Soil Data Centre (ESDAC) based on the outcomes of Reference [32] upon request. Based on various soil properties related to the preservation capacities of the different soil types, the datasets were used as a proxy for archaeological subsurface evidence in case the objects are buried in a specific soil context. The soil properties considered by Reference [32] were hydrology, acidity and alkalinity, solute types and concentrations, the levels of dissolved organic matter in the soil, the vulnerability of soil to erosion, stiffness, as well as other factors that favor preservation of stratigraphic evidence. The soil classification was based on the Soil Geographical Database of Eurasia (SGDBE), which is the only harmonised soil database for Europe [33]. It contains a geographic database SGDBE (polygons) to which soil attributes are attached. The 1 km × 1 km rasters are available upon request and after registration to the system [34].

In the study of Reference [32], subsurface cultural evidence was classified in four different categories, namely (1) bones, teeth, and shells (bones); (2) organic materials (organics); (3) metals (Cu, bronze, and Fe) (metals); and (4) stratigraphic evidence (strati). The latest describes archaeological contexts that are interpretable from the chronological succession of layers of deposited material in soil and can be better preserved in soils that are receiving continuing inputs of parent material such as sediments during flood events. More information regarding the methodology adopted and details on the grouping of subsurface archaeological evidence can be found in Reference [32].

Figures 1 and 2 visualise the outcomes from Reference [32] for the preservation capacities for buried materials and stratigraphy based on the soil properties across Europe. Numeric values were assigned to each preservation category (poor = 1, fair = 2, and good = 3). The latest was defined concerning endpoints (i.e., destruction) within 10^2 y (poor), after 10^2 and before 2000 y ($10^{3.3}$ y) (fair), and after $10^{3.3}$ y (good). Areas covered by artificial surfaces, permanent ice or snow, as well as water bodies were excluded from the analysis (these areas have a value that equals 0) (for more details, refer to Reference [32]).

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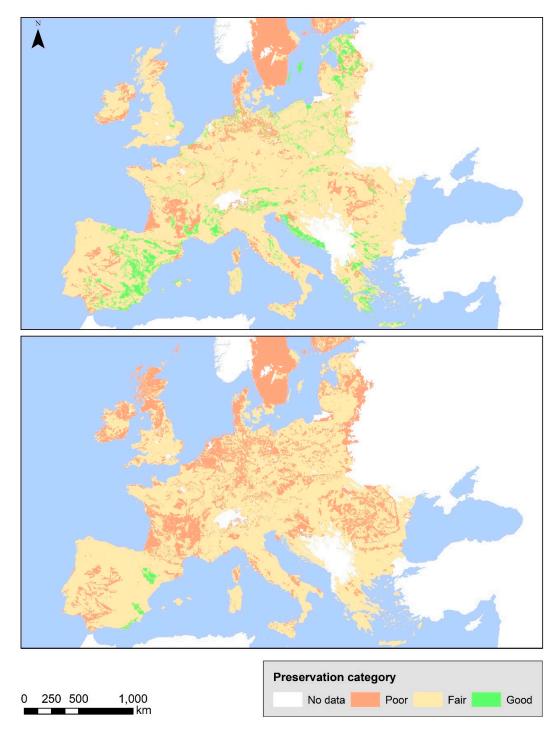


Figure 1. Preservation capacities of buried materials and stratigraphy across Europe for metals (top) and bones (bottom) (data source: References [32,35]).

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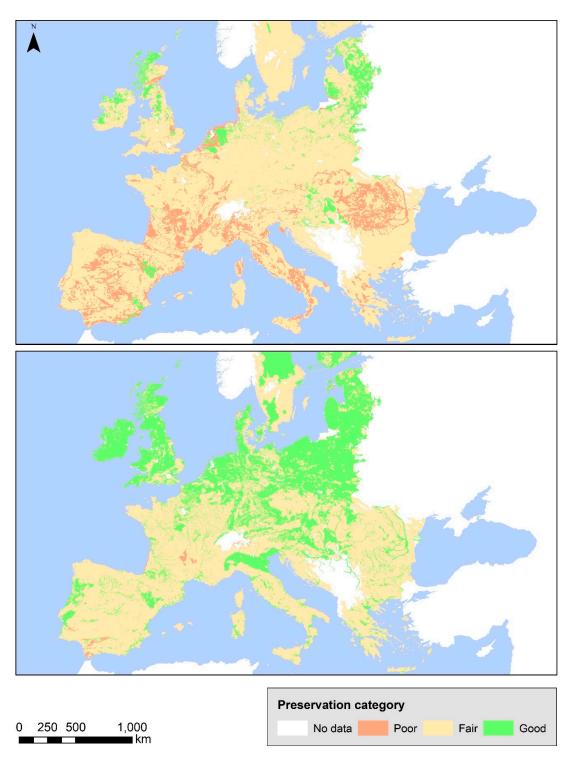


Figure 2. Preservation capacities of buried materials and stratigraphy across Europe for organic materials (top) and stratigraphic evidence (bottom) (data source: References [32,35]).

2.2. Data Related to Soil Loss by Water in Europe

Soil loss provoked by water activity expressed in tons per hectare per year was requested and downloaded through the European Soil Data Centre (ESDAC), modeled after Reference [16]. The estimation of soil loss was based on a modified version of the RUSLE model (RUSLE2015), and it was used to estimate soil loss in Europe for the year 2010. The modified model improved the quality of

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estimation on a high-resolution (100 m) dataset [36]. Figure 3 illustrates the results, grouped in the following five classes: (1) 0–2 t/ha per year, (2) 2–5 t/ha per year, (3) 5–10 t/ha per year, (4) 10–50 t/ha per year, and (5) >50 t/ha per year.

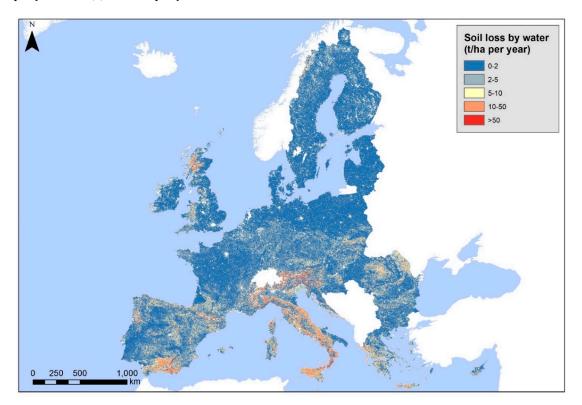


Figure 3. Soil loss (by water) expressed in tons per hectare per year (data source: References [16,35]).

2.3. Methodology

Figure 4 shows the overall methodology implemented in this study. Initially, the two datasets were downloaded from the European Soil Data Centre (ESDAC) database, as mentioned earlier. Then, the analysis scale was adjusted to 1 km for both datasets in order for both studies to meet the same spatial resolution. Next, the soil loss provoked by water activity was classified into the following three categories: (1) areas with soil loss from 0 until 5 t/h per year were considered areas with low threat, (2) areas with soil loss from 5 until 10 t/h per year were considered areas of moderated threat, and (3) areas with soil loss beyond 10 t/h per year were considered areas of high risk. Afterwards, for each one of the above three categories, the subsurface hazard for each material (1: metals, 2: bones, 3: organics, and 4: stratigraphy) was estimated. The processing of all datasets was carried out in the ESRI ArcGIS v10.6 environment. Finally, zonal statistical analysis was carried out using as reference level the nomenclature of territorial units for statistics (NUTS) level 0 (country level).

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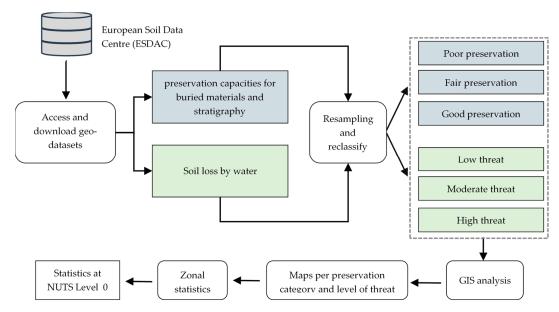


Figure 4. Overall methodology of the study.

3. Results

The results of this study showed that 75% of area is characterised as low threat due to soil erosion (i.e., soil loss less than 5 t/ha per year) while another 13% and 12% are characterised as moderate (soil loss between 5–10 t/ha per year) and high-risk (soil loss more than 10 t/ha per year) areas, respectively. Also, based on the findings of Reference [32], shown in Figures 1 and 2, approximately 42.9% of the area is characterised by poor preservation status; based on the soil properties, 53.2% of the area had fair preservation status, and only 3.9% of the area had good preservation status for all four different materials examined.

Figure 5 illustrates the overall results for the four categories of subsurface materials and the level of threat from soil erosion for each one of these materials. In addition, the preservation state of each type of stratigraphic material is mapped as poor (red), fair (yellow), and good (green). Areas with no data available are visualised with white colour in the background.

As evident in Figure 5, most of the areas—for all four types of archaeological material—are considered as low-threat areas regardless of their soils' preservation capacity. For the moderate- and high-threat areas, differentiations are observed between European regions. As expected, southern European countries such as those of the Mediterranean basin are more exposed to soil-loss threats compared to the northern ones [16]. In addition, more concrete insights concerning the preservation status and stratigraphic material are shown in Figure 5. For instance, areas characterised as "fair" in terms of the preservation status for metals, bones, and stratigraphy evidence, indicated with yellow colour at Figure 5, seem to have a moderate-to-high threat from soil loss in the northern European areas. Areas which can highly preserve archaeological evidence in their subsoil (good soil preservation capacity indicated with green colour in Figure 5) and which present low amounts of soil loss are mainly concerning bones and stratigraphic materials. However, similar areas (good soil preservation capacity indicated with green colour in Figure 5) are evident in high-risk areas (third column of Figure 4) for all four different groups of archaeological materials, though in a smaller geographic extent.

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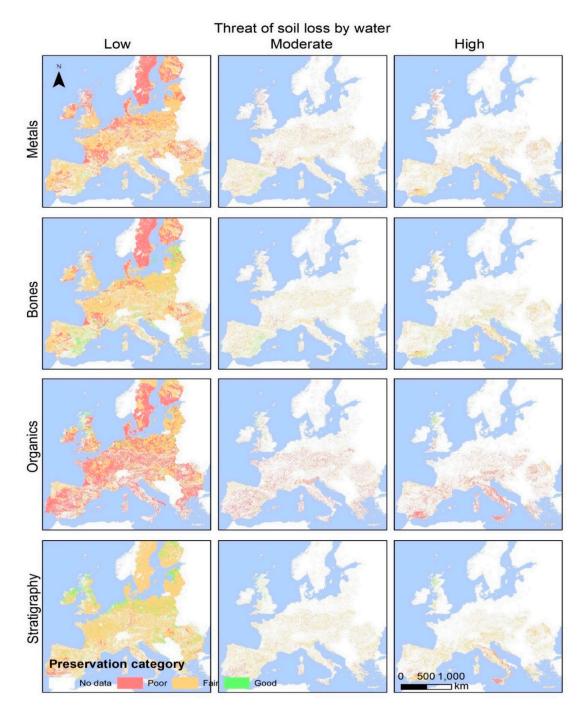


Figure 5. Maps indicating the level of threat (low, moderate, and high) based on soil loss provoked by water activity (soil erosion) for each of the four different subsurface materials (metals, bones, organics, and stratigraphy evidence): The preservation state is also indicated (red for poor, yellow for fair, and green for good).

A quantitative analysis followed, and the results are presented in Figure 6. The first row shows the overall statistics for areas characterised as low threat by soil loss. Similarly, the findings for areas characterised as moderated and high threat by soil loss are visualized in the second and third rows of Figure 6. Evidently, the majority of the subsurface evidence is considered a low threat by soil erosion (first row of Figure 6). In specific, more than 70% of metals in poor and fair conditions of preservation are within low-threat areas, while similar observations can be seen for the bones and

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organic evidence. In contrast, approximately 65% of the stratigraphy evidence is within areas characterised by low threat from soil loss. It should be mentioned that 25.2% of the area has a zero value for "no data" (not shown in Figure 5).

Following the interpretation of the findings of Figure 6, we can record that only 10–12% of the areas are threatened by soil loss, described by moderated and high threat (second and third rows respectively), with some fluctuations. While this is the same for all types of materials (metals, bones, organics, and stratigraphy), their preservation statuses are different. Also, areas characterised with good preservation status of the soil are less than 10% for all types of archaeological materials and sometimes even less than 1%, which is aligned with the work of Reference [32].

Table 1 shows the absolute areas, which are expressed in square kilometers per subsurface archaeological material (metals, bones, organics, and stratigraphy) per soil threat (low, moderate, and high) and preservation status (poor, fair, and good). Only a few areas in European territory feature good preservation status (last column of Table 1), while for some materials such as bones, it is extremely low. In contrast, fair preservation conditions for all types of materials are recorded.

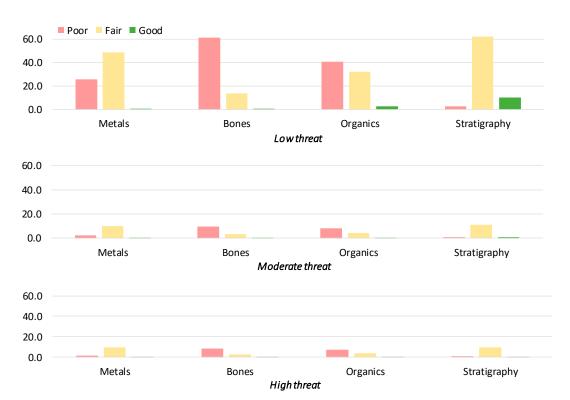


Figure 6. Quantitative analysis of the findings of Figure 4 for low (1st row), moderate (2nd row), and high (3rd row) threat from soil loss by water for the four different subsurface materials discussed in this study (metals, bones, organics, and stratigraphy evidence) and the preservation status.

Table 1. Absolute areas of the subsurface materials studied here (metals, bones, organics, and stratigraphy) per soil threat (low, moderate, and high) and preservation status (poor, fair, and good).

Subsurface Evidence	Soil-Loss Threat	Area (square km) Preservation Status					
	Son-Loss Threat	Poor	Fair	Good			
Metals	Low	1,013,220	1,913,126	7212			
	Moderate	95,775	394,794	6304			
	High	68,053	378,232	3652			
Bones	Low	2,401,458	527,333	5319			
	Moderate	375,144	121,650	128			

	High	337,612	112,308	27	
Organics	Low	1,589,420	1,251,800	92,890	
	Moderate	317,705	167,038	12,179	
	High	293,477	146,249	10,221	
	Low	94,458	2,443,859	395,793	
Stratigraphy	Moderate	33,563	423,471	39,888	
	High	42,113	383,364	24,470	

Zonal statistics using as reference level the nomenclature of territorial units for statistics (NUTS) level 0 (country level) was then carried out. The overall findings of this analysis are shown in Figures 7–10 and in Table A1 (Appendix A). In specific, Figure 7 indicates the mean values per country level for metals in regard to the level of soil-loss threats. Values close to 1 indicate poor status of preservation, values close to 2 indicate fair conditions of preservation, and values close to 3 good preservation status. Similarly, Figures 8–10 indicate the results for bones, organics, and stratigraphic evidence, respectively.

As evident from these findings, regardless of the type of subsurface material (i.e., metal, bones, organics, and stratigraphy), the mean value of the preservation status—per country level—is characterised as poor or moderate. Some fluctuations between the countries examined here can be observed, for instance, for Estonia (EE) and Lithuania (LT) compared to Italy (IT) and Greece (HE). The majority of the potential cultural heritage wealth is characterised with low threat from soil loss for all types of subsurface material (indicated with blue colour in Figures 7–10), while areas characterised as moderated and high risk from soil loss by water (indicated with orange and grey colour in Figures 7–10) are quite small—in comparison to areas characterised with low threat. However, significant diversification between the European countries exist, for instance, for Greece (HE), Spain (ES), and Italy (IT) in comparison to northern European countries such as Estonia (EE) and Netherlands (NL).

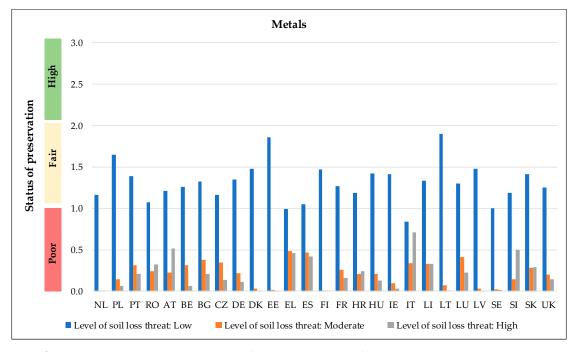


Figure 7. Mean values per country level for metals per level of soil-loss threats: Values close to 1 indicate poor status of preservation, values close to 2 indicate fair conditions of preservation, and values close to 3 good preservation status.

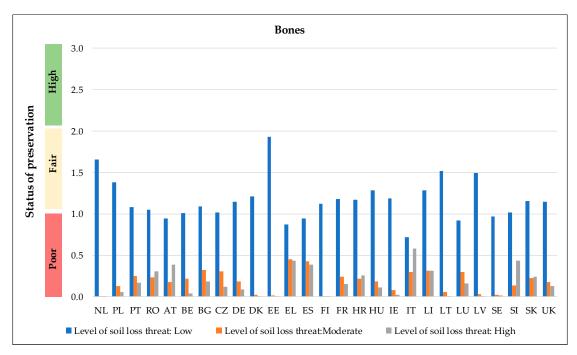


Figure 8. Mean values per country level for bones per level of soil-loss threats: Values close to 1 indicate poor status of preservation, values close to 2 indicate fair conditions of preservation, and values close to 3 good preservation status.

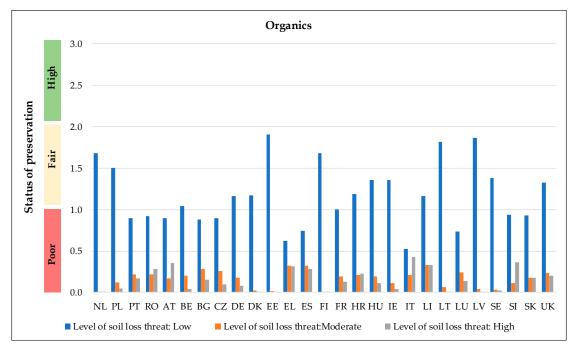


Figure 9. Mean values per country level for organics per level of soil-loss threats: Values close to 1 indicate poor status of preservation, values close to 2 indicate fair conditions of preservation, and values close to 3 good preservation status.

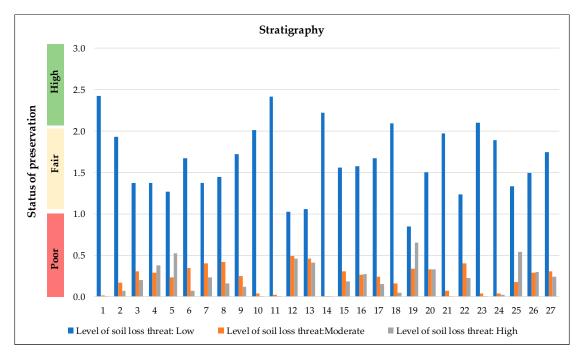


Figure 10. Mean values per country level for bones per level of soil-loss threats: Values close to 1 indicate poor status of preservation, values close to 2 indicate fair conditions of preservation, and values close to 3 good preservation status.

Regression analysis was then performed to understand any correlations—at a country level—between the various types of subsurface materials studied here and the level of soil-loss threats. The results are shown in Figures 11–13 for low, moderate, and high levels of soil-loss threat, respectively. The mean values per country level for the category of metals was set as a reference line ($R^2 = 1$), whereas the rest of the three types of materials, namely the bones, organics, and stratigraphy, were plotted against this reference line (i.e., metals). At a low level of soil-loss threat (Figure 11), mean values of the preservation state for all types of materials—per country level—do not seem to follow any pattern or correlation. The preservation state—at this level of soil-loss threat—ranges from poor to fair and good, while the regression values (R^2) range from 0.41 to 0.56 and indicate no strong correlation between the different types of materials.

However, this observation changes once we plot the results for the next two levels of soil-loss threat, namely the moderate (Figure 12) and high (Figure 13) levels. Once again, the mean values per country level for metals was set as reference observation and the rest of the materials were plotted against these measurements. Two observations can be drawn from Figure 12 (moderate level of threat) and Figure 13 (high level of threat): firstly, the preservation state at this level of soil loss is characterised as poor (same as Figures 7–10); secondly, a strong correlation between all the subsurface materials (correlation coefficient R² between 0.88 and 0.97) exists, indicating similar trends for all types of subsurface materials on a European scale.

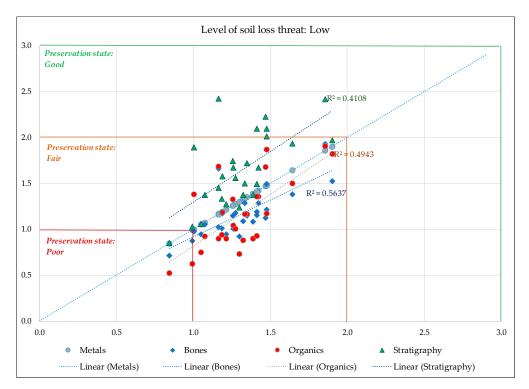


Figure 11. Correlation of the different types of subsurface objects (metals, bones, organics, and stratigraphy) between areas characterized as low for soil-loss threat: Metals objects were used as the baseline (R = 1). Preservation state is also indicated for areas with different colours (red for poor preservation state, yellow for fair preservation state, and green for good preservation state).

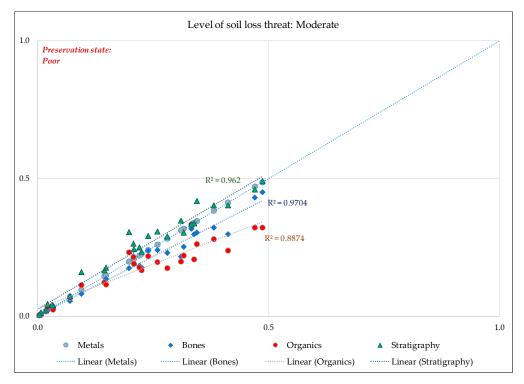


Figure 12. Correlation of the different types of subsurface objects (metals, bones, organics, and stratigraphy) between areas characterized as moderate for soil-loss threat: Metals objects were used as the baseline (R = 1). Preservation state is also indicated for areas with different colours (same as Figure 11. Note here that only poor preservation state is shown).

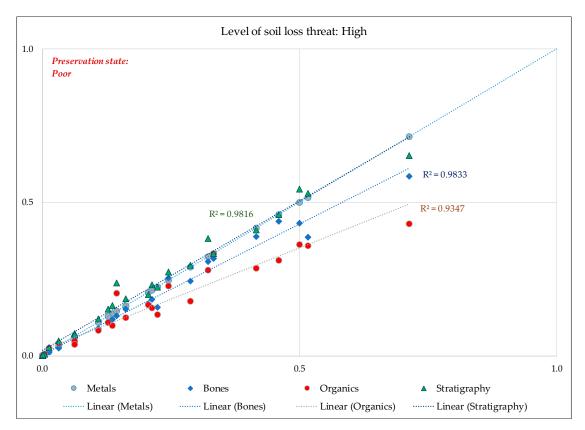


Figure 13. Correlation of the different types of subsurface objects (metals, bones, organics, and stratigraphy) between areas characterized as moderate for soil-loss threat: Metals objects were used as the baseline (R = 1). Preservation state is also indicated for areas with different colours (same as Figure 11. Note here that only poor preservation state is shown).

4. Discussion

This communication capitalises on the results of two important studies carried out in the recent past [16,32] and estimates on a European scale the threat that potential subsurface archaeological materials (bones, metals, organics, and stratigraphic evidence) face. The estimation was made taking into account both the said materials and soil properties in combination with the soil loss provoked by water activity (soil erosion). Towards this direction, geodata from the aforementioned studies were imported into a GIS environment for further analysis. Four general remarks are underlined:

- Remark 1: Most of the European countries are considered low threat areas for all types of subsurface materials;
- Remark 2: Northern countries (e.g., Scandinavian) are almost exclusively considered low threat areas in contrast to Mediterranean countries, which are characterised with moderate and high risk. As a Mediterranean example, in Italy, the mean soil loss by water per year equals that of areas characterised as low or high risk for bone materials. This indicates that subsurface material in this country is widely exposed and threaten by soil loss in comparison to other countries;
- Remark 3: Areas characterised as low threat from soil erosion present approximately 10% of good preservation capacity, which varies depending on the type of the material.
- Remark 4: Similar patterns on a European scale for all types of materials are reported for areas characterised with moderate and high risk from soil loss.

Results from this study are biased due to the limitations of the two large extended geodatabases, namely the soil loss by water and the preservation of materials and stratigraphic evidence in soils. While assumptions and models have been implemented in both the studies of References [16,32] such as the Revised Universal Soil Loss Equation (RULSE) model used for estimation of the soil loss by water for the first study and the accuracy of the soil maps for the second study, the overall findings

visualise and quantify for the first time potential threat of the subsurface cultural remains, as a result of soil erosion. While these results presented here are only a proxy on a country level and on a European level, it is evident that wider strategies can be developed in the future to support a better and higher resolution systematic monitoring of subsurface archaeological context in Europe for its potential loss of archaeological wealth by soil erosion.

In this direction, earth observation technologies and especially the European Space program Copernicus with its Sentinel missions can support this task. Space-based observations can deliver high-resolution products (up to 10-m resolution) and can therefore provide more details for targeted areas of interest, especially after heavy rainfalls or dramatic land-use changes. Optical Sentinel 2A and 2B sensors can be used to support a higher resolution soil erosion model (e.g., RUSLE) by providing inputs regarding the status of vegetation (through vegetation indices, e.g., Normalised Vegetation Difference Index (NDVI)), the land cover through classification methods, and maps of pertinent conservation practices. The FFO (Full-Free and Open-access) policy of the Copernicus program minimises the overall cost for such targeted investigations. In addition, space-based observations with the contributing missions of the Copernicus program (which includes very high-resolution satellite sensors) can also be used to map archaeological proxies, i.e., evidence for subsurface archaeological remains through crop-marks and soil-marks.

5. Conclusions

Several scientific studies evidence the various hazards threatening European cultural heritage, such as earthquakes [37-41], fires [42-44], soil erosion [45,46], landslides [47], floods [48], and urbanisation [49,50]. A special mention and growing interest regarding climate change and its impact on cultural heritage is reflected in recent literature [51,52].

Preserving subsurface archaeological remains is still a challenging task which needs to be further considered and addressed. This communication consists of the first European-scale investigation of the levels of soil loss and its impact on archaeological remains and strati. Despite limitations and assumptions, the study presented an overall trend at the country level through the exploitation of published open-access geodata. In addition, the methodology developed can be supported by earth observation sensors and can be further implemented elsewhere, blended together with local models and archaeological proxies of subsurface archaeological remains.

Future studies could also consider urbanisation, agricultural practices, land use changes, etc. for a complete understanding of both anthropogenic and natural hazards that affect the subsurface archaeological context. Such studies can support more comprehensive actions to prevent the loss of subsurface archaeological remains or to a priori protect areas with potential archaeological value. In addition, specific studies for the quantification of magnitudes of daily soil erosion can be explored in relation to climate changes understanding (e.g., increase of sat floods events). Finally, soil deposition based on soil erosion process can also be explored.

In light of the forthgoing, this communication comprises a proxy for soil loss by water threats to potential subsurface archaeological remains. This study does not intend to replace specific and local implemented studies but rather to provide a more general view on a European scale. Despite the eloquent limitations of this study, it can be used as a steppingstone to better understand on broader scales, namely on the European scale, the potential threat on subsurface archaeological evidence.

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Conflicts of Interest: The authors declare no conflict of interest.

Appendix A

Table A1. Mean values of soil loss per country level for each type of subsurface material. Values close to 1 indicate poor status of preservation, values close to 2 indicate fair conditions of and values close to 3 good preservation status.

Subsurface archaeological evidence			Metals Bones			Organics			Stratigraphy				
Level of soil-loss threat (L: low; M: moderate; and H: high)													
Country	CODE	L	M	Н	L	M	Н	L	M	Н	L	M	Н
Netherlands	NL	1.2	0.0	0.0	1.7	0.0	0.0	1.7	0.0	0.0	2.4	0.0	0.0
Poland	PL	1.6	0.1	0.1	1.4	0.1	0.1	1.5	0.1	0.0	1.9	0.2	0.1
Portugal	PT	1.4	0.3	0.2	1.1	0.3	0.2	0.9	0.2	0.2	1.4	0.3	0.2
Romania	RO	1.1	0.2	0.3	1.1	0.2	0.3	0.9	0.2	0.3	1.4	0.3	0.4
Austria	AT	1.2	0.2	0.5	0.9	0.2	0.4	0.9	0.2	0.4	1.3	0.2	0.5
Belgium	BE	1.3	0.3	0.1	1.0	0.2	0.0	1.0	0.2	0.0	1.7	0.3	0.1
Bulgaria	BG	1.3	0.4	0.2	1.1	0.3	0.2	0.9	0.3	0.2	1.4	0.4	0.2
Czech Republic	CZ	1.2	0.3	0.1	1.0	0.3	0.1	0.9	0.3	0.1	1.4	0.4	0.2
Germany	DE	1.3	0.2	0.1	1.1	0.2	0.1	1.2	0.2	0.1	1.7	0.2	0.1
Denmark	DK	1.5	0.0	0.0	1.2	0.0	0.0	1.2	0.0	0.0	2.0	0.0	0.0
Estonia	EE	1.9	0.0	0.0	1.9	0.0	0.0	1.9	0.0	0.0	2.4	0.0	0.0
Greece	EL	1.0	0.5	0.5	0.9	0.4	0.4	0.6	0.3	0.3	1.0	0.5	0.5
Spain	ES	1.1	0.5	0.4	0.9	0.4	0.4	0.7	0.3	0.3	1.1	0.5	0.4
Finland	FI	1.5	0.0	0.0	1.1	0.0	0.0	1.7	0.0	0.0	2.2	0.0	0.0
France	FR	1.3	0.3	0.2	1.2	0.2	0.2	1.0	0.2	0.1	1.6	0.3	0.2
Croatia	HR	1.2	0.2	0.2	1.2	0.2	0.3	1.2	0.2	0.2	1.6	0.3	0.3
Hungary	HU	1.4	0.2	0.1	1.3	0.2	0.1	1.4	0.2	0.1	1.7	0.2	0.2
Ireland	IE	1.4	0.1	0.0	1.2	0.1	0.0	1.4	0.1	0.0	2.1	0.2	0.0
Italy	IT	0.8	0.3	0.7	0.7	0.3	0.6	0.5	0.2	0.4	0.9	0.3	0.7
Liechtenstein	LI	1.3	0.3	0.3	1.3	0.3	0.3	1.2	0.3	0.3	1.5	0.3	0.3
Lithuania	LT	1.9	0.1	0.0	1.5	0.1	0.0	1.8	0.1	0.0	2.0	0.1	0.0
Luxembourg	LU	1.3	0.4	0.2	0.9	0.3	0.2	0.7	0.2	0.1	1.2	0.4	0.2
Latvia	LV	1.5	0.0	0.0	1.5	0.0	0.0	1.9	0.0	0.0	2.1	0.0	0.0
Sweden	SE	1.0	0.0	0.0	1.0	0.0	0.0	1.4	0.0	0.0	1.9	0.0	0.0
Slovenia	SI	1.2	0.1	0.5	1.0	0.1	0.4	0.9	0.1	0.4	1.3	0.2	0.5
Slovakia	SK	1.4	0.3	0.3	1.2	0.2	0.2	0.9	0.2	0.2	1.5	0.3	0.3
United Kingdom	UK	1.3	0.2	0.1	1.1	0.2	0.1	1.3	0.2	0.2	1.7	0.3	0.2
		Status o	f Prese	rvation:	1: poor	r; 2: fair	; and 3:	good					

Appendix B

Geodatasets related to the findings of Figure 5 can be accessed at the open access institutional repository of the Cyprus University of Technology (KTISIS), under the "Copernicus Earth Observation Big Data for Cultural Heritage -NAVIGATOR" project (https://ktisis.cut.ac.cy/cris/project/pj00350). The geodatasets indicate the level of threat (low, moderate, and high) based on soil loss provoked by water activity (soil erosion) for each of the four

different subsurface materials (metals, bones, organics, and stratigraphy evidence). The preservation state is also mentioned (poor, fair, and good).

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