

Cluster and discriminant analysis of agricultural soils from Manica province in Mozambique

Introduction

Abstract

The quality of agricultural soils is a critical factor for the environmental and socio-economic sustainability of a rural region [1]. Few studies about the quality of agricultural soils of Mozambique could be found in literature [2-4]. Five samples soils from agricultural farms of Manica province, two of Manica and three of Sussundenga district, were collected by random sampling (Figure 1). The random sampling was done in a zigzag manner collecting for each soil by three times during four years from 2021 to 2024. Five soils in each sampling time with a total of fifteen samples were collected [5].

Twenty-seven physical-chemical parameters were analyzed for all the fifteen samples: extractable ions (K, Mg, Ca, Fe, Mn, Zn, Cu and B), exchangeable ions (Na, K, Ca, Mg and Al), cation exchange capacity (CEC), fertility properties of soils (total limestone, active limestone, pH_{H2O}, pH_{KCl}), extractable P, organic carbon, organic matter, N total, N nitrate, conductivity and texture (sand, clay and silt) [5].

A multivariate analysis design was used to classify the soil samples under research. Cluster analysis (supervised hierarchical and non-supervised K means) was performed in order to evaluate the similarity of the soil samples and the statistically significant variables that contribute to the variability of the model. Also, a non-supervised two-step cluster and discriminant analysis were performed in order to further explore the results of the initial cluster analysis [6-8]. In this multivariate analysis the variables extractable B, exchangeable Al and active and total limestone were not considered for the analysis, and not presented in Table 1, due to the fact that the values found for all the soils were unchanged and are below the limit of detection of the analytical methodology used.

The non-standardized supervised hierarchical cluster analysis for the five samples at each sampling time resulted in a two-cluster model and for the all the fifteen soil samples along the time a three-cluster model. By a non-hierarchical K means cluster analysis the more stable model, for the five samples at each sampling time, was found with the two clusters model and, for all the fifteen samples along the time, was found for the three-cluster model. The two-step cluster analysis confirmed these previous results. The more and the less important predictor found for each of the five samples for the three sampling times is not the same. For all the fifteen samples the more important predictor found with is the extractable K and the less important predictor is the N nitrate. The discriminant analysis confirms the previous cluster models for the five samples at each sampling time and for all the fifteen samples along the time.

References

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Figure 1: The map of Mozambique (with its provinces) with the Manica province highlighted with its districts. The red arrows indicate the areas where soil samples were collected. Adapted from reference [2].

Table 1: Characteristics of the soil samples in campaigns 2021/2022 (first row = Y1), 2022/2023 (second row = Y2) and 2023/2024 (third row = Y3).

Property	M1	M2	S1	S2	S3
Extractable K (mg/kg)	137	139	131	131	131
Extractable Mg (mg/kg)	249	249	249	249	249
Extractable Ca (mg/kg)	100	100	100	100	100
Extractable Fe (mg/kg)	100	100	100	100	100
Extractable Mn (mg/kg)	100	100	100	100	100
Extractable Zn (mg/kg)	100	100	100	100	100
Extractable Cu (mg/kg)	100	100	100	100	100
Extractable B (mg/kg)	100	100	100	100	100
Extractable Al (mg/kg)	100	100	100	100	100
Extractable P (mg/kg)	100	100	100	100	100
Extractable N (mg/kg)	100	100	100	100	100
Extractable S (mg/kg)	100	100	100	100	100
Extractable Cl (mg/kg)	100	100	100	100	100
Extractable I (mg/kg)	100	100	100	100	100
Extractable Br (mg/kg)	100	100	100	100	100
Extractable F (mg/kg)	100	100	100	100	100
Extractable Li (mg/kg)	100	100	100	100	100
Extractable Na (mg/kg)	100	100	100	100	100
Extractable K _{ex} (mg/kg)	100	100	100	100	100
Extractable Mg _{ex} (mg/kg)	100	100	100	100	100
Extractable Ca _{ex} (mg/kg)	100	100	100	100	100
Extractable Fe _{ex} (mg/kg)	100	100	100	100	100
Extractable Mn _{ex} (mg/kg)	100	100	100	100	100
Extractable Zn _{ex} (mg/kg)	100	100	100	100	100
Extractable Cu _{ex} (mg/kg)	100	100	100	100	100
Extractable B _{ex} (mg/kg)	100	100	100	100	100
Extractable Al _{ex} (mg/kg)	100	100	100	100	100
Extractable P _{ex} (mg/kg)	100	100	100	100	100
Extractable N _{ex} (mg/kg)	100	100	100	100	100
Extractable S _{ex} (mg/kg)	100	100	100	100	100
Extractable Cl _{ex} (mg/kg)	100	100	100	100	100
Extractable I _{ex} (mg/kg)	100	100	100	100	100
Extractable Br _{ex} (mg/kg)	100	100	100	100	100
Extractable F _{ex} (mg/kg)	100	100	100	100	100
Extractable Li _{ex} (mg/kg)	100	100	100	100	100
Extractable Na _{ex} (mg/kg)	100	100	100	100	100
Extractable K _{ex} (mg/kg)	100	100	100	100	100
Extractable Mg _{ex} (mg/kg)	100	100	100	100	100
Extractable Ca _{ex} (mg/kg)	100	100	100	100	100
Extractable Fe _{ex} (mg/kg)	100	100	100	100	100
Extractable Mn _{ex} (mg/kg)	100	100	100	100	100
Extractable Zn _{ex} (mg/kg)	100	100	100	100	100
Extractable Cu _{ex} (mg/kg)	100	100	100	100	100
Extractable B _{ex} (mg/kg)	100	100	100	100	100
Extractable Al _{ex} (mg/kg)	100	100	100	100	100
Extractable P _{ex} (mg/kg)	100	100	100	100	100
Extractable N _{ex} (mg/kg)	100	100	100	100	100
Extractable S _{ex} (mg/kg)	100	100	100	100	100
Extractable Cl _{ex} (mg/kg)	100	100	100	100	100
Extractable I _{ex} (mg/kg)	100	100	100	100	100
Extractable Br _{ex} (mg/kg)	100	100	100	100	100
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Extractable Ca _{ex} (mg/kg)	100	100	100	100	100
Extractable Fe _{ex} (mg/kg)	100	100	100	100	100
Extractable Mn _{ex} (mg/kg)	100	100	100	100	100
Extractable Zn _{ex} (mg/kg)	100	100	100	100	100
Extractable Cu _{ex} (mg/kg)	100	100	100	100	100
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Extractable Al _{ex} (mg/kg)	100	100	100	100	100
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Extractable Mg _{ex} (mg/kg)	100	100	100	100	100
Extractable Ca _{ex} (mg/kg)	100	100	100	100	100
Extractable Fe _{ex} (mg/kg)	100	100	100	100	10